Front Cover Credits

1. Pine (P. radiata) cells grown in liquid culture and marked with fluorescent probes to indicate live cells (green) and the cell walls of all cells (blue).
2. Using AI to Make Better AI: New approach brings faster, AI-optimized AI that runs efficiently on IoT devices
3. A monolithic array of SS 316L 3D-printed MEMS corona ionizers and close-up of a single tip; devices can be used as electrohydrodynamic gas pumps.
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We are pleased to bring to you the 2020 Microsystems Annual Research Report.

MTL’s core mission has been to foster interdisciplinary research and education as well as strong industrial relation in microsystems and technology. MTL has maintained a wide footprint of research that encompasses broad areas of disciplines. They include nanoscale technology and materials as well as nano and microscale devices and systems. MTL’s research portfolio includes a diverse array of novel devices as electronic, magnetic, field emitter, thermal, fluidic, superconducting and quantum devices, as well as integrated circuits and systems, machine learning and neuromorphic computing, biological and medical devices and systems, photonics, and energy.

Since MTL’s research has been at the forefront of technology, an advanced, flexible fabrication facility has always been a critical element of MTL. In that regard, the completion of the ultramodern MIT.nano two years ago marked a new era for MTL. The availability of such an advanced, grand-scale fabrication facility is poised to dramatically improve MTL’s position in cutting-edge research. It is therefore, natural that MTL has been closely collaborating with and financially supporting MIT.nano since 2016. For closer collaboration, the 2020 Microsystems Annual Research Conference was organized and sponsored jointly by MTL and MIT.nano for the first time. To go one step further, we put together the Microsystems Annual Research Report jointly between MTL and MIT.nano for the first time.

The MTL/MIT.nano joint Microsystems Annual Research Report represents a broad cross-section of the MIT community, with 90+ faculty, 121 students, postdoctoral associates, and research staff participating. As the pages ahead demonstrate, an astonishing range of insights and innovations emerge from the users of MIT’s shared facilities. It is a privilege to serve this remarkable community. On behalf of the staff of MIT.nano and MTL, we offer our gratitude for the inspiration you spark in us every day. We know the innovations represented in this report will translate into impact in the world, and we are excited to see what comes next.

Hae-Seung Lee
Director, Microsystems Technology Laboratories

Vladimir Bulović
Director, MIT.nano

August 2020
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Biological, Medical Devices, and Systems

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Analytical and Numerical Modeling of Microphones for Fully Implantable Assistive Hearing Devices ........................ 14
In vitro plant culture models provide valuable insights into factors governing plant growth and development. Improved understanding of genetic and biochemical pathways in plants has facilitated advancements in a variety of industries—from guiding the development of more robust crops, to enabling increased biofuel yields by tuning biomass genetics. Despite the utility of plant culture models, translation of cellular findings to the plant-scale is hindered in current culture systems. These limitations are, in part, because culture systems fail to recapitulate physical aspects of the natural cellular environment. This work investigates the role of extra-cellular mechanical and chemical influences such as scaffold stiffness, hormone concentrations, media pH, and cell density on cell development and growth patterns. Early results indicate that tuning of biomechanical and biochemical cues leads to cell growth which deviates from typical culture morphologies and better resembles natural plant tissue structures.

New analytical methods and measurement metrics were developed to monitor cell enlargement, elongation, and differentiation in response to altered culture conditions. Through factorial design of experiments, optimal conditions for maintenance of long-term cell viability or elevated differentiation rates have been identified. Maps of cell response over a range of extracellular conditions allows for tuning of plant cell models to allow for the exhibition of desired physiological compositions. With the aid of these new data maps, plant tissues which are traditionally difficult to access or study in real-time can be better replicated for study in the laboratory setting.

▲ Figure 1: Zinnia elegans cells (a) shortly after isolation from leaves; cells exposed to varied growth conditions may grow into patterns of (b) bulbous, cell aggregates, or (c) uncoordinated, elongated cells.

FURTHER READING

Conformable Ultrasound Patch with Energy-efficient In-memory Computation for Bladder Volume Monitoring

K. Brahma, L. Zhang, V. Kumar, A. P. Chandrakasan, C. Dagdeviren, A. E. Samir, Y. C. Eldar
Sponsorship: Texas Instruments

Continuous monitoring of urinary bladder volume aids management of common conditions such as post-operative urinary retention. Urinary retention is prevented by catheterization, an invasive procedure that greatly increases urinary tract infection. Ultrasound imaging has been used to estimate bladder volume as it is portable, non-ionizing, and low-cost. Despite this, ultrasound technology faces fundamental challenges limiting its usability for next generation wearable technologies. (1) Current ultrasound probes cannot cover curved human body parts or perform whole-organ imaging with high spatiotemporal resolution. (2) Current systems require skilled manual scanning with attendant measurement variability. (3) Current systems are insufficiently energy-efficient to permit ubiquitous wearable device deployment.

We are developing an energy-efficient body contour conformal ultrasound patch capable of real-time bladder volume monitoring. This system will incorporate (1) deep neural network (DNN) based segmentation algorithms to generate spatiotemporally accurate bladder volume estimates and (2) energy-efficient static random-access memory (SRAM) with in-memory dot-product computation for low-power segmentation network implementation. We aim to develop platform technology embodiments deployable across a wide range of health-monitoring wearable device applications requiring accurate, real-time, and autonomous tissue monitoring.

We are training a low-precision (pruned and quantized weights) DNN for accurate bladder segmentation. DNNs are computation-intensive and require large amounts of storage due to high dimensionality data structures with millions of model parameters. This shifts the design emphasis towards data movement between memory and compute blocks. Matrix vector multiplications (MVM) are a dominant kernel in DNNs, and In-Memory computation can use the structural alignment of a 2D SRAM array and the data flow in matrix vector multiplications to reduce energy consumption and increase system throughput.

Figure 1: The flowchart of an energy-efficient system implementing a compressed segmentation network using SRAM designed for in-memory dot product computation.

FURTHER READING
Arterial Blood Pressure Estimation Using Ultrasound Technology

A. Chandrasekhar, C. G. Sodini, H.-S. Lee
Sponsorship: MEDRC-Philips, MIT J-Clinic, CICS

Hypertension, or high blood pressure (BP), is a major risk factor for cardiovascular diseases. Doctors prefer monitoring BP waveforms of ICU patients as the morphology and absolute values of these signals help to assert the cardiovascular fitness of the patient. At present, doctors use invasive radial catheters to record these waveforms. Invasive transducers are inconvenient and can be painful and risky to the patient. Hence, we are developing an algorithm to estimate BP waveforms using non-invasive ultrasound measurements at the brachial and carotid arteries.

Ultrasound probes are a commonly used sensing modality for non-invasive cardiovascular imaging. For instance, doctors use a linear array transducer to image superficial blood vessels like the brachial or the carotid artery. These multifunctional probes can record the lumen area waveform of these arteries and measure the velocity of the blood. In this project, we will record the aforementioned signals with a commercial ultrasound probe and a custom-designed probe (see Figure 1) and use the physics of the arterial pulse wave transmission to estimate the shape and absolute values of the pressure waveform. The pressure waves originating from the heart traverse the arterial wall with a velocity commonly referred to as pulse wave velocity (PWV). According to the physics of the arterial pulse wave transmission, we can calculate PWV from the ultrasound signals. Compliance and pulse pressure of the pressure waves in the artery may be obtained using the Bramwell-Hill equation. Finally, absolute values of the pressure will be derived using a combination of a transmission line model of the artery and machine learning algorithms.

Figure 1: Final design of the ultrasound based probe.
Figure 2: Ultrasound transducer placed above the carotid artery.

FURTHER READING

Blood pressures of arteries and veins are valuable indicators of cardiovascular health. Systolic and diastolic arterial pressure can be obtained in vivo noninvasively and accurately with a blood pressure cuff on one of the limbs. However, no noninvasive means to evaluate lumen pressure in veins exists other than visual assessment of the internal jugular vein, which often requires ample skill to execute despite its inaccuracy. What is more, venous pressure is constantly evaluated in the context of congestive heart failure in determining diuretic treatment. Heart failure cardiologists face the difficult decision between ordering an invasive test with plenty of inherent risk or noninvasively but inaccurately evaluating jugular venous pressure.

Our group has developed a force-coupled ultrasound probe attachment, providing the ability to measure the force applied by an ultrasound probe for each image obtained. We can segment a superficial blood vessel of fewer than 5 cm of depth and without bone between it and the skin to track its deformation in response to external force applied by the ultrasound probe. Furthermore, we can create a forward finite-element model of a blood vessel cross section to predict vessel deformation in response to the known force applied. We can nest this forward model into a combined iterative inverse model with the observed force and vessel deformation to optimize over the lumen pressure by comparing predicted deformation to observed deformation. This method has the potential to noninvasively and accurately derive sampled arterial and venous pressure waves.
Development of Fully-automated and Field-deployable Sample Preparation Platform Using a Spiral Inertial Microfluidic Device

H. Jeon, J. Han
Sponsorship: NIH, Ohana Bioscience

Sample separation is a key step in sample preparation to isolate target analytes from interferents in the biofluid sample for a particular analysis. As the current standard, centrifugation and affinity-based (labeling) methods or their combination are used for sample separation. Although those methods themselves are straightforward, they are labor-, energy-, and time-intensive and require large volumes of sample (on the order of 1 mL) and well-trained operators; expensive labeling reagents should be employed for the labeling methods. More importantly, the centrifugation process and cell labeling can cause damage of sample (e.g., ex vivo cell activation), which leads the challenges in assessing the host’s immune response or leukocyte functions correctly.

To overcome these limitations, we propose a new type of spiral cell-sorting process using a multi-dimensional double spiral (MDDS) device, where particles are concentrated through a first smaller-dimensional spiral channel and subsequently separated through a second, larger-dimensional spiral channel (Figure 1a). Because of the initial focusing in the first spiral channel, particle dispersion can be significantly decreased, and smaller particles can be effectively extracted into the outer-wall side of the channel, resulting in increase of separation resolution (Figure 1b). To obtain a more purified and concentrated output, we also developed a new recirculation platform based on a check-valve that allows only one-way flow. In the platform, the separated output can be extracted back into the input syringe by the withdrawal motion of a syringe pump and processed again through the MDDS device by the infusion motion of a syringe pump, resulting in higher purity and concentration (Figure 1c). The developed platform can be operated in a fully-automated or even hand-powered manner with a great separation performance. Therefore, we expect that the developed platform could provide an innovative sample preparation solution for point-of-care analyses and diagnostics.

▲ Figure 1: (a) Schematic diagram of operation of the MDDS device. (b) Movement of particles having 6- and 10-μm diameters in the MDDS device compared to the single spiral device. (c) Check-valve-based recirculation method.
Biologics are drugs produced from any biological source (e.g., mammalian cells, bacteria, yeast). Biologics include recombinant therapeutic proteins, vaccines, monoclonal antibodies, and other living cells. Because of their high effectiveness and reduced complications, biologics can be used to treat many complex conditions, such as cancers and autoimmune disorders, and are transforming modern medicine. Biologics are typically produced through a biomanufacturing process including large-scale bioreactor cultivation, purification, and quality checks. Quality checking is critical during this process; quality deviation can significantly compromise drug efficacy and safety.

To ensure the quality of biologics, quality control laboratories at manufacturing sites routinely use conventional analytical technologies, such as liquid chromatography and mass spectroscopy. Most analytical technologies require (1) labor intensive manual sample preparation, (2) large sample volume, and (3) technical expertise from scientists/technicians. In addition, these techniques have limited data throughput due to offline and discontinuous analysis. To overcome these limitations, micro/nanofluidics can be used to monitor critical quality attributes during biomanufacturing. With the advantages of easy automation, continuous-flow, and small sample volume, micro/nanofluidic technologies can produce a large amount of quality data for improved quality control and understanding of biologics. Previously, our group introduced a new nanofluidic device for continuous-flow multi-parameter quality analytics. Recently, this nanofluidic device was integrated with continuous biomanufacturing to monitor protein size in a fully automated, continuous, online manner (Figure 1).

We are expanding the capability of our nanofluidic device to monitor other critical quality attributes such as binding affinity and glycosylation of monoclonal antibodies during biomanufacturing. With optimization of the monitoring system, we aim to achieve “real-time” and “multi-modal” quality analytics. This nanofluidic analytics is expected to improve the safety and efficiency of biomanufacturing in the future.
Measuring Eye Movement Features Using Mobile Devices to Track Neurodegenerative Diseases
H.-Y. Lai, G. Saavedra-Peña, C. G. Sodini, T. Heldt, V. Sze
Sponsorship: MIT Quest for Intelligence (SenseTime), MIT-IBM Watson AI Lab

Current clinical assessment of neurodegenerative diseases (e.g., Alzheimer’s disease) requires trained specialists, is mostly qualitative and is commonly done only intermittently. Therefore, these assessments are affected by an individual physician’s clinical acumen and by a host of confounding factors, such as a patient’s level of attention. Quantitative, objective and more frequent measurements are needed to mitigate the influence of these factors.

A promising candidate for a quantitative and accessible diseases progression monitor is eye movement. In the clinical literature, an eye movement is often measured through a pro/anti-saccade task, where a subject is asked to look towards/away from a visual stimulus. Two features are observed to be significantly different between healthy subjects and patients: reaction time (time difference between a stimulus presentation and the initiation of the corresponding eye movement) and error rate (the proportion of eye movements towards the wrong direction). However, these features are commonly measured with high-speed, IR-illuminated cameras, which limits the accessibility. Our goal is to develop a novel system that measures these features outside of the clinical environment.

Previously, we showed we can accurately measure reaction time using iPhone cameras, by combining a deep convolutional neural network (CNN) for gaze estimation with a model-based approach for saccade onset determination. We showed that there is significant intra- and inter-subject variability in reaction time, which highlights the importance of individualized tracking. We have since developed an app to facilitate data collection and include error rate measurement. With a large amount of data, we can validate the effect of age on these features and identify confounding factors, leading to a better understanding of relationship between eye movement features and disease progression. By facilitating repeat measurements, our framework opens the possibility of quantifying patient state on a finer timescale in a broader population than previously possible.

Figure 1: Eye movement features measurement pipeline. We record the subject with the frontal camera of an iPad. We process the video with an eye tracking algorithm and calculate reaction time and error rate.

Figure 2: Relationship between age and eye movement features.

FURTHER READING
Noninvasive Monitoring of Single-cell Mechanics by Acoustic Scattering


Sponsorship: NCI

The monitoring of mechanics in a single cell throughout the cell cycle has been hampered by the invasiveness of mechanical measurements. Here we quantify mechanical properties via acoustic scattering of waves from a cell inside a fluid-filled vibrating cantilever with a temporal resolution of < 1 min. Through simulations, experiments with hydrogels, and the use of chemically perturbed cells, we show that our readout, the size-normalized acoustic scattering (SNACS), measures stiffness. To demonstrate the noninvasiveness of SNACS over successive cell cycles, we used measurements that resulted in deformations of < 15 nm. The cells maintained constant SNACS throughout interphase but showed dynamic changes during mitosis. Our work provides a basis for understanding how growing cells maintain mechanical integrity and demonstrates that acoustic scattering can be used to noninvasively probe subtle and transient dynamics.

FURTHER READING

Optogenetics is a technique that uses visible light stimulation to activate or inhibit neurons genetically modified to express light-sensitive proteins from the microbial rhodopsin family. It offers light-sensitive opsin proteins to the region of interest and provide advantages such as cell type specificity, millisecond temporal precision, and rapid reversibility. Furthermore, compared to the electrical stimulation, it causes negligible electrical perturbation to the environment, which enables simultaneous electrical recording while stimulating a region of interest. The stimulation of the targeted neurons can be achieved using lasers, light-emitting diode (LED)-coupled optical fibers, or wireless μLEDs.

This work presents a modular, light-weight head-borne neuromodulation platform that achieves low-power wireless neuromodulation and allows real-time programmability of the stimulation parameters such as the frequency, duty cycle, and intensity. This platform is composed of two parts: the main device and the optional intensity module (Figure 1). The main device is functional independently; however, the intensity control module can be introduced on demand (Figure 2). The stimulation is achieved through the use of LEDs directly integrated in the custom-drawn fiber-based probes. Our platform can control up to 4 devices simultaneously, and each device can control multiple LEDs in a given subject. Our hardware uses off-the-shelf components and has a plug-and-play structure, which allows for fast turnover time and eliminates the need for complex surgeries. The rechargeable, battery-powered wireless platform uses Bluetooth Low Energy (BLE) and is capable of providing stable power and communication regardless of orientation. This platform presents a potential advantage over the battery-free, fully implantable systems that rely on wireless power transfer, which is typically direction-dependent, requires sophisticated implantation surgeries, and demands complex experimental apparatuses. Although the battery life is limited to several hours, this is sufficient to complete the majority of behavioral neuroscience experiments. Our platform consumes 0.5 mW and has a battery life of 12 hours.

**FURTHER READING**

Targeted drug delivery has been an area of active investigation for many decades. Some approaches target cell-borne receptors; others use external stimuli such as heat or radio waves to drive spatially-localized release. In this work, particles estimate their own location within the body by correlating their sensed fluid environment (e.g. temp., press., salinity, sugar, pH, etc.) against an embodied map and release on the basis of this estimate; the approach is related to terrain contour matching (TERCOM), a technique used in air navigation. Preliminary explored particle concepts have included liposomes and proteins (bottom-up fab) and thin films (top-down fab). As envisioned, a mixture of drug-laden and empty permeable vessels, each with a different environmental response, interconnect through a capacitive volume separated from the surroundings by a permeable film. In another envisioned approach, the monomer sequence of polypeptides or other polymers is selected to provide the greatest activity in preferred capillaries, the sequence of experienced environments affecting the conformation. In both, using item response theory, the mixture’s or particle’s composition is tailored to deliver a larger dose or greater activity to preferred capillaries. A chip concept that implements a microarray with a half-toned chemical library and material data drawn from conventional surgical analogs has also been considered as a means of screening candidate compositions for the desired spatial sensitivity. Overall, the work builds on a past effort by the PI and his group to develop nanoparticles which record their experience in DNA. Current efforts focus on the theory of estimating location within the body from vectors of sensed variables and on the development of concepts for particles and chips. The ultimate objective is to demonstrate a nanoparticle that implements TERCOM- or DSMAC-like navigation in the body and a chip that can evaluate its selectivity. The concept is outlined in Figure 1.

Figure 1: Illustration of concept; environmentally sensitive vessels release differentially more drug to capillaries when traveling along preferred paths.

FURTHER READING

Nowadays wearable electronics such as sweat sensors targeting key biomarkers have been heavily investigated. However, these electronics typically contain only one sensor for each type of analyte and the performance is evaluated and optimized separately. When applied to real-world application with complex environment, the reproducibility and the reliability of such device is questionable. Here we present a platform technology for multiplexed, large-area sensing array for more reliable measurement. Graphene is used as signal transducer because of its high surface-to-volume ratio and excellent electrical properties. By utilizing a material jetting 3D printer, we can deposit different types of functionalization on specific regions of the array to achieve multiplexed sensing. Here we demonstrate a fully integrated sensing array with three types of ion-selective membranes (ISMs) to achieve detection of sodium, potassium and calcium (see Figure 1). Each types of functionalization covers over 70 working devices and in total more than 200 devices are functional in one array.

The sensor array is first tested with various concentration of solutions contain pure K, Na or Ca ions. All three types of sensors show excellent Nernstian sensitivity towards their target ion and moderate level of sensitivity towards other two types of ions. Using Principle Component Analysis, we can cluster and identify the type of ion as shown in Figure 2. The sensor array is also tested with a set of mixture solutions that are prepared by fixing the concentration of interfering ions while varying concentration of a specific type of ions. Similar clusters are observed indicating the sensor array’s ability for identifying which type of ion concentration is changing within a complex mixture solution. This work demonstrates the possibility of achieving highly reliable multiplexed sensing array that can be deployed in complex environments. By collecting data from a statistically significant sample size, we would be able to apply more sophisticated statistical methods or machine learning models to further associate complex mixtures for real-world applications.

FURTHER READING

Analytical and Numerical Modeling of Microphones for Fully Implantable Assistive Hearing Devices

Sponsorship: NIH

Fully implantable cochlear implants (CIs) could take advantage of the natural enhancement of pressure and binaural cues afforded by the outer ear. They would also allow for hearing 24/7 and mitigate the limitations and inconvenience of an external device. To enable a fully implantable CI, we are developing two piezoelectric implantable microphones to be embedded inside a cochlear implant electrode array or the middle ear cavity as shown in Figure 1. The first type senses pressure along the CI array and has a form factor similar to conventional CI arrays. It will not sense at the base of the cochlea where unwanted noise can originate and scarring and bony growth occurs. The latter sits adjacent to the eardrum and senses any umbo displacement. We have built prototypes of such piezoelectric microphones made with polyvinylidene fluoride (PVDF), a piezoelectric film. We have inserted these prototype microphones inside the scala tympani through the round window and in the middle ear cavity. Preliminary tests show promise for achieving good sensitivity, low noise, and wide bandwidth with this structure.

Our approach combines analytical models for design guidance, numerical models for design verification, and bench-test experiments for validation. Analytical modeling is driven by the differential equations of solid mechanics and piezoelectricity. Numerical modeling is enabled by the COMSOL Multiphysics software where we have created simulations of the piezoelectric sensor and use ear mechanics measurements to choose the appropriate boundary conditions.

Progress has been made to advance both prototypes into a practical implantable microphone. We have created a platform for system optimization and started the iterative design process. In the near future we will begin sensing circuit design which will modify the system’s overall sensitivity. We will verify numerical model parameters, conduct bench testing imitating cochlear conditions, develop surgical implantation methods, and generate device manufacturing processes.

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The quest for a suitable wide-bandgap semiconductor for high-power and high-frequency applications is well motivated; wide-bandgap semiconductors generally exhibit a high breakdown field and can therefore support a high voltage over short distances. Diamond (5.5 eV) in particular is an attractive prospect since its thermal conductivity and radiation hardness far surpass that of other wide-bandgap semiconductors. However, practical transistors require the ability for the charge density to be engineered through substitutional doping, which has proven to be difficult considering the strong covalent bonds that make up bulk diamond.

We use an alternative doping mechanism, surface transfer doping; it takes advantage of the unformed bonds at the diamond surface and generates a highly conductive 2D hole sheet at the surface with carrier densities up to 10^14 cm^-2. Surface transfer doping using stable high electron affinity transition-metal oxides (TMO) such as WO₃ along and the novel contact-first process explored in this work shows great promise to advance process stability while maintaining the high current densities desired for future power diamond transistors.

We are exploring various methods to reproducibly achieve high values of sheet hole concentration and hole mobility on the diamond surface that can be incorporated into a transistor fabrication process. Our proposed design for characterizing mobility and surface conductivity combines a transmission line and Van der Pauw test structures simultaneously, as shown in Figure 1. We chose tungsten as the ohmic contact for its thermal stability and attractive process characteristics. We are examining different H-plasma processes for diamond surface bond passivation and the use of the hydrogen isotope deuterium. Preliminary results show increased carrier concentration and mobility with Al₂O₃ as the surface dopant, as in Figure 2. The methods explored in this work show promise towards the enhancement of diamond conductivity and reproducibility.

**FURTHER READING**

Dynamic Approach to Quantifying Strain Effects on Ionic and Electronic Defects in Functional Oxides

Y.-T. Chi, T. Defferriere, H. L. Tuller, B. Yildiz, K. Van Vliet
Sponsorship: DoE, Basic Energy Sciences

The search for novel electronic and magnetic properties in functional oxides has generated a growing interest in understanding the mobility and stability of ionic and electronic defects in these materials. Instead of altering material content, most research views mechanical strain as a lever for modulating defect concentration and mobility more finely and continuously in both semi-conductors and functional oxides. Previous studies also proposed that strain may increase ionic mobility by orders of magnitude, which is crucial for lowering the operation temperature of solid oxide fuel cells.

However, experimental and computational results from research groups differ significantly due to the convoluted effect of mechanical strain and film/substrate interface on defect content and mobility. Such reliance on substrate selection to induce strain in the oxide thin film also limits the range of strain accessibility, with limited data available to date.

We have developed an experimental technique that facilitates application of in-plane strain to functional oxide thin films continuously on the same substrate. First, we combine photolithography and metal sputtering in MIT Nano to deposit an interdigitated Pt electrode down to a 2-micrometer finger distance on our sample (Figure 1). Next, we conduct 3- or 4-point bending and concurrent conductivity measurement of the thin film-on-substrate device (Figure 2). This approach is accessible to a wide temperature range and has precise gas control relevant to mixed ionic-electronic conducting oxides with extremely high reproducibility (error < 3%) over a long period of time. We can strain and measure the transport properties of the same functional oxide thin film at high temperature in situ, over a range of strains applied to a single system. Combining these experiments with our ab initio computational simulations and predictions of carrier dominance over a range of strains and temperatures, we also aim to measure the carrier mobility in Nb-doped SrTiO3 as a function of applied strain, to observe the sudden change of carrier mobility and temperature dependency. We believe this will also be a powerful technique for studying the strain effect on surface reactions like exsolution or catalytic reaction.

FURTHER READING


▲Figure 1: Photolithography for interdigitated electrode pattern on photoresist, followed by Pt deposition using sputtering. OM pictures of Pt interdigitated electrode on single crystal YSZ with 2-um finger distance.

▲Figure 2: Finished sample with interdigitated Pt electrode. Y2O3-doped zirconia, Nb-doped SrTiO3, and Pr-doped CeO2 (left to right). Schematic of impedance measurement with 3-point bending on sample. Impedance reproducibility showcase on single-crystal YSZ at 350C for 10 measurements over 5 hrs with < 3% error.
The power density (and form-factor) of power electronic circuits is mostly dominated by the size of the passive energy storage components like inductors and capacitors, which depend on the switching frequency. Increasing the switching frequency of power electronic circuits can significantly reduce the energy storage requirement of these components to allow for smaller components. However, the maximum operating frequency of state-of-the-art GaN transistors, promising candidates for high-voltage compact switches, is usually limited by the gate inductance between the gate electrode and the driver circuit. Monolithically integrating the GaN-based driver circuit with that of the GaN power transistor on the same chip can significantly reduce this inductance.

To increase the efficiency of such GaN-based integrated circuits, a CMOS-like circuit technology is needed. Major benefits of such a technology include zero/negligible static power dissipation, higher noise immunity, and linearity. However, the lack of high-performance GaN p-FETs and the challenges of their monolithic integration with E-mode n-FET devices are major roadblocks towards achieving such a technology. This work demonstrates a new GaN-based complementary circuit platform on 6-inch Si substrate.

Figure 1(a) shows the voltage transfer characteristics (VTC) of the inverter for a VDD of 5 V along with output current. The inverter shows a record voltage gain of 27 V/V for a voltage switching of 0-to-5 V. Figure 1(b) shows the VTC of the same inverter for VDD=3 V, exhibiting excellent inverting behavior with Vswing=2.91 V and maximum gain of ~15 V/V. The dynamic switching of the inverter was characterized by connecting the inverter input to a pulse generator and the output to the high impedance port of an oscilloscope. The VDD was kept at 3 V because of the high gate leakage in the p-GaN gated n-FET above that voltage. The voltage of the input pulses varied from ~0.2 V to 3 V with a ramp time of 100 ns. Figure 1(c)-(d) presents measured waveforms of the input and output signals. The output signal showed a voltage swing close to 0~3 V. The fall time was 1 µs; the rise time was 20 µs. It should be noted that these times represent an upper bound on the fall and rise times, as the very high input capacitance of the oscilloscope port (~ 350 pF) limits the measurements.

High-temperature measurement of the inverter shows a reduction in the voltage gain, as shown in Figure 2. The maximum available voltage swing at the output is also reduced due to the rise of low-level Vout, which can be attributed to the reduction in ON-OFF current ratio of the p-FET at high temperature. At high temperature, because of the higher activation of Mg dopants, the threshold voltage of p-FET moves towards the positive zone, making it D-mode, which in turn reduces the ON-OFF current ratio.

While room exists for significant performance improvement, this demonstration opens a number of application domains for GaN such as integrated CMOS driver circuits, CMOS logic, logic, and signal conditioning under harsh environment operation, among many others.

FURTHER READING
GaN-CMOS-technology could be instrumental towards realizing high-power-density, high-speed, low-form-factor, and highly-efficient power electronic circuits, which sparked many efforts to develop a high performance GaN p-FET. However, most of these demonstrations show normally-ON operation with ON-resistance over 1 kΩ-mm. GaN/AlGaN heterostructure-based p-FET shows low ON-resistance because of higher 2-DHG density and hole mobility but with D-mode operation. A GaN/AlN heterostructure based p-FET shows E-mode operation with RON of 640 Ω-mm. However, n-FET integration with this p-FET requires regrowth.

In this work, we demonstrate a self-aligned p-FET with a GaN/Al0.2Ga0.8N (20 nm)/GaN heterostructure grown by metal-organic-chemical vapor deposition (MOCVD) on Si substrate. The utilization of GaN-on-Si platform offers lower cost, availability of 200-mm-diameter substrates, and potential to integrate with high performance logic and analog functionality.

While most of the GaN p-FET demonstrations so far in the literature mainly focused on recessed gate MISFET structure, we choose to develop a self-aligned structure (see Figure 1 for the device structure) as it offers the following advantages over a recessed gate MIS p-FET: (1) the shortest possible source to the drain distance, cutting down the access region; (2) low ON-resistance because of negligible access resistance: and (3) easier gate alignment.

Our 100-nm channel length self-aligned device with recess depth of 70 nm exhibits a record ON-resistance of 400 Ω-mm and ON-current over 5 mA/mm with ON-OFF ratio of 6×105 when compared with other p-FET demonstrations based on a GaN/AlGaN heterostructure (see Figure 2 for benchmarking of our device with other p-FET demonstrated in the literature). The device shows E-mode operation with a threshold voltage of −1 V, making it a promising candidate for a GaN-based complementary circuit that can be integrated on a Si platform. A monolithically integrated n-channel transistor with p-GaN gate is also demonstrated.
Characterizing and Optimizing Qubit Coherence Based on SQUID Geometry


* These authors contributed equally

Sponsorship: ODNI, IARPA, DoD via MIT Lincoln Laboratory

Superconducting qubits are leading candidates to implement quantum hardware capable of performing certain computational tasks more efficiently than their classical counterparts. A prerequisite for scalable quantum computation is a sufficiently low noise level in the participating qubits. The dominant source of decoherence in frequency tunable superconducting qubits is 1/f flux noise, presumably originating from magnetic defects located at the interfaces of their SQUID loops.

Here, we measure the flux noise amplitudes of more than 50 capacitively shunted flux qubits and study their dependence on geometric parameters of their SQUID loops. Each of six chips (Figure 1) holds ten capacitively shunted flux qubits, featuring two copies of five different SQUID loop geometries, respectively. Dispersive readout of each qubit is performed using a common transmission line and individual readout resonators. We perform a series of spin-echo measurements in the vicinity of the flux sweet spot of the qubits, showing that the pure dephasing rate is proportional to the slope of the qubit spectrum, which is in turn related to the flux noise amplitude for each qubit.

Our data (Figure 2) show good agreement with a previously presented microscopic model for independent spin impurities, which has so far eluded experimental verification. Due to a limited applicability of the proposed model for superconducting films of finite thickness, we provide numerical simulations of the current distribution in our SQUIDs, which extend and refine the considered model. Our improved model is in excellent quantitative agreement with our data both in terms of absolute numbers and geometry dependence (Figure 2b).

Our results demonstrate that flux noise is suppressed in SQUIDs with small perimeters, fat wires, and thick superconducting films therefore serve as a guide for minimizing the flux noise susceptibility in future circuits.

FURTHER READING

Control of Conducting Filaments Properties in TiO2 by Structural and Chemical Disorder for Neuromorphic Computing

N. Emond, B. Yildiz
Sponsorship: Fonds de Recherche du Québec - Nature et Technologies (FRQNT)

Resistive switching (RS) random access memories are considered as possible artificial synapses in next-generation neuromorphic networks, mostly due to their predicted high memory density, energy efficiency and scalability. Integration of these devices in a neuromorphic computing system could allow solving intensive computing tasks actually only handled by the human brains such as speech and character recognition as well as grammar and noise modeling. Within their architecture, redox-based RS memory devices store binary code information using the electric field-induced resistance change of an oxide layer by conductive filament (CF) formation and rupture (Figure 1a). Nevertheless, a lack of control on the properties of CFs, which mainly forms at chemical and structural defects, causes detrimental cycle-to-cycle and device-to-device variations.

We are therefore studying the effect of strain on the microstructure, chemistry and RS properties of TiO2 thin films to get insights into defects formation with the objective of selectively doping along these defects (Figure 1b). We found that the microstructural properties of pulsed laser deposited epitaxial TiO2 films depend on both the film thickness and the nature of the bottom electrode, suggesting a potential method to better control defects properties and improve consistency in RS.

Figure 1: (a) Resistive switching mechanism in a TiO2 thin film by formation of conductive filaments and (b) its control by selective doping at microstructural defects.

FURTHER READING

Manipulation of Coupling and Magnon Transport in Magnetic Metal-insulator Hybrid Structures

Y. Fan, J. Finley, J. Han, L. Liu
Sponsorship: NSF, SRC-NRI, NSF-MRSEC

Ferromagnetic metals and insulators are widely used for generation, control, and detection of magnon spin signals. Most magnonic structures are based primarily on either magnetic insulators or ferromagnetic metals, while heterostructures integrating both of them are less explored. Here, by introducing a Pt/yttrium iron garnet (YIG)/permalloy (Py) hybrid structure grown on Si substrate (Figure 1(a)), we studied the magnetic coupling and magnon transmission across the interface of the two magnetic layers. After the film growth by magnetron sputtering, atomic force microscopy (AFM) measurements were performed (Figure 1(b)) to characterize the film quality, which indicates a surface roughness of approximately 1 nm. Moreover, we found that within this structure, Py and YIG exhibit an antiferromagnetic coupling field as strong as 150 mT, as evidenced by both the vibrating-sample magnetometry (VSM) (Figure 1(c)) and polarized neutron reflectometry measurements. By controlling individual layer thicknesses and external fields, we realize parallel and antiparallel magnetization configurations, which are further utilized to control the magnon current transmission. We show that a magnon spin-valve with an ON/OFF ratio of ~130% can be realized out of this multilayer structure at room temperature through both spin pumping and spin Seebeck effect experiments. Owing to the efficient control of magnon current and the compatibility with Si technology, the Pt/YIG/Py hybrid structure could potentially find applications in magnon-based logic and memory devices.

Figure 1: (a), Schematic of the Pt/YIG/Py/Ru hybrid structure grown on the Si/SiO2 substrate. (b), AFM image of the YIG surface for the Si/Pt/YIG film, indicating a roughness of around 1 nm. (c), VSM measurements of the Si/Pt/YIG/Py/Ru sample and Si/Pt/YIG/MgO/Py/Ru sample. Inset shows results from control samples of Si/Pt/Ru and Si/Pt/YIG. The schematics show the magnetization orientation of the YIG and Py layers in the Si/Pt/YIG/Py/Ru hybrid structure in different magnetic field regions.

FURTHER READING

Nonvolatile Control of Long-distance Spin Transport in an Easy-plane Antiferromagnetic Insulator

J. Han, P. Zhang, Y. Fan, T. S. Safi, J. Xiang, R. Cheng, L. Liu
Sponsorship: NSF, NIST

How an antiferromagnet transmits spin angular momentum by the quanta of spin-wave excitations, viz. magnons is one of the core topics of antiferromagnetic magnon spintronics. It is generally believed that only easy-axis antiferromagnets can support spin transmission, a natural inference of the fact that the circularly polarized magnons there have finite spin angular momentum. In contrast, easy-plane antiferromagnets would destroy spin transport due to the vanished angular momentum carried by their linearly polarized magnons.

In this work we show that contrary to this traditional picture, spin transmission over micrometer distance indeed happens in an easy-plane insulating antiferromagnet, α-Fe2O3 thin film. A model involving superposition of linearly polarized propagating magnons is proposed to account for the observations. Enabled by this physical insight, our work opens up additional possibilities for nonvolatile, low magnetic field control of spin transmission, where a spin-current switch with a 100% on/off ratio is realized.
Antiferromagnetic spintronics is an emerging field with potential to realize high-speed memory devices. Compared to ferromagnetic materials, antiferromagnetic dynamics are less well understood, partly due to their high intrinsic frequencies that require terahertz techniques to probe. Here, we introduce the layered antiferromagnetic insulator CrCl3 as a tunable platform for studying antiferromagnetic dynamics. Because of weak interlayer coupling, the antiferromagnetic resonance (AFMR) frequencies are within the range of typical microwave electronics (<20 GHz). This allows us to excite different modes of AFMR and to induce a symmetry-protected mode crossing with an external magnetic field. We further show that a tunable coupling between the optical and acoustic magnon modes can be realized by breaking rotational symmetry. Recently, strong magnon-magnon coupling between two adjacent magnetic layers has been achieved, with potential applications in hybrid quantum systems. Our results demonstrate strong magnon-magnon coupling within a single material and therefore provide a versatile system for microwave control of antiferromagnetic dynamics. Furthermore, CrCl3 crystals can be exfoliated down to the monolayer limit, allowing device integration for antiferromagnetic spintronics.

We transferred layered bulk CrCl3 onto a coplanar waveguide (CPW) and secured it with Kapton tape. The crystal c-axis is normal to the CPW plane. We measure microwave transmission in a cryostat by fixing the excitation frequency and sweeping the applied magnetic field. When the field is applied in-plane and parallel to the in-plane radio frequency field, both acoustic and optical modes of AFMR are observed. The mode frequency evolutions are well-described by theoretical formulas. When the field is canted out-of-plane, two magnon modes hybridize because of rotational symmetry breaking, and the coupling strength is tunable by rotation angle. Our results demonstrate that CrCl3 serves as a convenient platform for studying AFMRs in microwave frequencies and shows the possibility to realize magnon-magnon coupling utilizing van der Waals assembly.

**FURTHER READING**

Quantum information processors hold the promise to solve specific computational problems much faster than classical computers. Superconducting qubits are among the leading candidates for realizing near-term quantum processors. Beyond lithographic scalability, superconducting qubits offer long computational operation windows—coherence times—relative to short operational gate times that have enabled the demonstration of the first practical quantum algorithms. Despite this progress, engineering challenges must be met to further scale these devices. In particular, qubits require a precisely engineered microwave environment to suppress energy decay and corresponding information loss. For instance, the corruption of information can occur due to lossy package modes interacting with the qubit electric field. As the number of qubits increases, qubit packages must be adapted to support an increasing number of input/output ports without adding additional loss channels.

Our qubit package, shown in Figure 1 (a), provides a well-defined electromagnetic (EM) environment. It consists of an aluminum-coated copper cavity and a microwave interposer with 32 waveguides. We performed full-wave simulations of the signal launches, the package cavity, and superconducting wirebonds to establish principles needed to construct larger packages. We evaluated the presence and absence of lossy package modes using high-coherence qubits as sensors, illustrated in panel (b).

A weakly driven package mode causes EM-field enhancement with increased microwave photon number fluctuations, which, when coupled to the qubit, shifts its energy levels. The resulting qubit energy fluctuations result in qubit dephasing inferable via Ramsey interferometry. Sweeping a probe tone in frequency while monitoring the coherence time reveals the presence of parasitic package modes. Panel (c) exhibits a mode-free operating environment up to 11 GHz. Our EM model can reproduce the observed package modes, shown in panel (d). Current work focuses on the design of packages to support more complex qubit chips and modular interconnects to facilitate fast chip exchange.

![Figure 1: (a) Microwave package with 32 signal lines to control 16-qubit chip mounted in package center. (b) Measurement setup to probe electromagnetic modes in qubit environment. Measured qubit is indicated with yellow dashed box. (c) Continuous coherence time measurements via Ramsey interferometry at probe tone frequencies between 2 and 20 GHz. Frequency range relevant to qubit is indicated by green horizontal bar. (d) EM simulation (COMSOL) of package resonance mode that corresponds to feature measured at 17.19 GHz.](image)
Properties of materials are controlled by the arrangement and type of atoms in the structure. Many characterization techniques can provide information about the crystal structure and microscale features, but atomic scale information is critical for fully understanding a material system. Through advanced scanning transmission electron microscopy (STEM) techniques, atomic column intensity and positions can be extracted to provide useful information about ordering, local distortions, and defects.

Materials such as strontium titanate, SrTiO₃, demonstrate the capabilities of this powerful imaging technique. Annular dark field (ADF) STEM imaging shows atom column contrast from Sr and Ti cations, as expected from the crystal structure, but no contrast from the oxygen anion atom columns due to the low atomic number of oxygen (Figure 1 a). Integrated differential phase contrast (iDPC) imaging in the STEM mode makes the lighter oxygen atoms visible (Figure 1 b). Additionally, the electric field vector map in projection can be found from the differential phase contrast data acquired from a four-segment detector (Figure 1 c). Projected charge density maps obtained from differential phase contrast imaging clearly show symmetrical charge contours revealing non-polar behavior in the SrTiO₃ sample (Figure 1 d). Such a projected charge density imaging technique is useful in studying polar functional material.

The positions and intensity of each atom column can be extracted from the STEM images using image analysis techniques. Detailed, quantitative analysis of bond lengths, bond angles, and atomic contrast can be used to find regions of order, local distortions, and defects. Structural nanoscale features such as ferroelectric/ferromagnetic domains or chemical/distortion-ordered regions can be correlated with the electrical, mechanical, ferroelectric, magnetic, and other properties of the material to elucidate the nanoscale origin of macroscale properties.
Degradation Under Forward Bias Stress of Normally-off GaN High Electron Mobility Transistors

E. S. Lee, J. A. del Alamo
Sponsorship: Texas Instruments

Energy-efficient electronics have been gaining much attention as a necessary path to meet the growing demand for energy and sustainability. GaN field-effect transistors (FETs) show great promise as high-voltage power transistors due to their ability to withstand a large voltage and carry a high current with minimum losses. For best circuit reliability and performance, a normally-off transistor is highly desirable. An attractive design is the p-doped gate AlGaN/GaN high electron mobility transistor (p-GaN HEMT).

Our research aims to better understand the reliability issues impeding widespread adoption of p-GaN power HEMTs for power management applications. One key issue is device degradation under electrical stress, where key device performance figures such as the threshold voltage and the gate leakage current change with electrical stress.

Understanding reliability issues of p-GaN power HEMTs is obstructed by the complex gate stack of the devices. First, both holes and electrons are present in the gate stack: holes in the p-doped GaN region and electrons in the 2-dimensional electron gas at the AlGaN/GaN interface. Furthermore, holes and electrons encounter several barriers (shown in the energy band diagram of Figure 1), obfuscating understanding of the electrostatics and transport physics under forward-bias stress. Coupled with the often time-dependent nature of degradation, p-GaN power HEMT reliability remains difficult to fully understand. For instance, Figure 2 shows the time evolution of the gate leakage with different constant gate voltage stress. As can be easily seen, the gate leakage current decreases with time at lower biases and high biases but increases with time at intermediate biases, showing a complex multi-regime behavior. Nevertheless, an on-going reliability analysis such as breakdown voltage indicates that p-GaN HEMTs show great promise as robust and efficient next-generation power transistors.

FURTHER READING

The great promise of Gallium Nitride Metal-Insulator-Semiconductor High Electron Mobility Transistors (GaN MIS-HEMTs) in the growing power electronic market has rapidly positioned these devices at the forefront of a new technology wave. This has triggered a vast amount of worldwide research and yielded continuous improvements in device performance and electrical reliability. Regarding reliability, a key consideration in any new device technology, the maximum breakdown voltage is ultimately limited by the vertical breakdown of the drain-body junction. This is particularly a concern for devices with conductive substrates.

A way to mitigate premature drain-body breakdown under high positive drain voltage consists of applying a positive voltage to the body with respect to the source so that the drain-body voltage can be reduced. A potentially problematic consequence of this is excessive source-body leakage current under off conditions. This is undesirable. In this work, we study the source-body leakage in commercially prototype devices for negative voltage at the source with respect to the body. Figure 1 shows the body current as the source is swept negative and then positive at 26. The different paths that are followed and the “eye” that appears could be due to trapping or a floating-body effect. Figure 2 shows the temperature dependence of the negative sweep. The sharp corner in the characteristics that coincides with the maximum widening of the “eye” opening appears to have a negative temperature coefficient of -0.13 eV. These and other interesting features are critical to understanding the origin of the reverse bias source-body current so that it can be suppressed.

**FURTHER READING**

Quantum Landscape Engineering of Superconducting Circuit Ground States for Higher-order Coupler Design


Sponsorship: Office of the Director of National Intelligence, IARPA, Assistant Secretary of Defense for Research & Engineering under Air Force

Superconducting circuits provide a versatile engineering platform for the study of quantum systems and their use as a computational resource. Their application ranges from studying fundamental principles such as the physics of quantum entanglement to the demonstration of large-scale control of quantum bits simulating spin models in solid state physics. Many-body interactions of multiple spins simultaneously are one aspect of spin models that has not been demonstrated to date.

In this work, we exploit that the response of the quantum ground state energy of a superconducting circuit to external magnetic flux can be shaped by design to engineer artificial spin couplers. We propose a methodology for adding higher-order polynomial terms into the ground state energy versus flux by strongly coupling a series of rf SQUIDs. The fundamental instance of two rf SQUIDs generating a ground state with 4th-order terms is implemented experimentally. Probing this circuit with a sensor flux qubit, the qubit’s transition frequency maps the derivative of the quartic ground state in accordance with simulation. Modest levels of qubit coherence are maintained despite the relatively strong inductive coupling. These results demonstrate the viability of this design for use as a 4-local coupler and show promise for extending it to higher polynomial order.
Vertical Gallium Nitride FinFETs for RF Applications

J. Perozek, A. Zubair, T. Palacios
Sponsorship: DARPA DREaM Project, GaN Energy Initiative

From wireless communication systems like the 4G and 5G cellular services that enable 4K video streaming to the high-resolution radars that are vital to national defense, radio frequency (RF) systems have become a ubiquitous part of modern life. A fundamental building block within these systems is the RF power amplifier. As amplifier technology progresses, the relentless demand for improved performance necessitates development of new transistor technologies that can operate at higher power levels and over larger bandwidths. While traditional planar processing techniques have led to countless successful RF amplifiers, the fact that all conduction takes place very near the wafer’s surface fundamentally limits their performance. If instead we utilize a compact vertical transistor design, the bulk material can be used to withstand large voltages in the vertical direction as opposed to lateral designs, which need large device areas. Additionally, bulk conduction improves thermal spreading, thereby reducing cooling needs, and vertical gate patterning techniques trade expensive high-resolution lithography for relatively easy control of etch depth.

This work presents novel vertical GaN RF transistors. As the cross-sectional diagram in Figure 1 shows, the vertical GaN RF finFET consists of narrow fins to confine the current and has sidewall gates to modulate the conductivity within the fins. To enable high-frequency system integration, these devices were fabricated on sapphire, a highly insulating substrate, with a top-side drain contact to remove the need for through-wafer vias. To reduce costs and allow easier integration with existing technology, the same devices can be fabricated on GaN on Si as well. Figure 2 shows a scanning electron microscope (SEM) cross section of a fabricated device. These devices achieve a current density of over 7 kA-cm⁻² and a power gain cut-off frequency, fmax, of 5.9 GHz, demonstrating a promising first step toward vertical GaN transistors in RF applications.

**Figure 1:** Cross-sectional schematic of the vertical GaN RF FinFET.

**Figure 2:** SEM cross-section of the fabricated devices taken in a focused ion beam system.

**FURTHER READING**
Towards Sub-10-nm-Diameter Vertical Nanowire III-V Tunnel FETs

Y. Shao, J. A. del Alamo
Sponsorship: Intel

Recently, III-V compound semiconductors have emerged as a promising family of materials for future complementary metal-oxide semiconductor (CMOS) technology, thanks to their superior electron transport properties. To enable continued scaling, a high aspect-ratio vertical nanowire (VNW) transistor geometry with a gate-all-around (GAA) structure is highly favorable due to effective charge control and robustness to short-channel effects. Another big advantage of the vertical nanowire geometry is that it allows engineering of the energy band structure along the transport direction, enlarging the device design space. In particular, device structures that potentially break the thermal limit of the subthreshold behavior become possible.

In our research, we are pursuing the demonstration of broken-band GaSb/InAs vertical nanowire tunnel field-effect-transistors (TFETs) with sub-10-nm diameter for ultra-low power logic applications. We aim to exploit the recent demonstration of high-quality III-V MOS interface characteristics using in-situ thermal atomic-layer etching in combination with atomic layer deposition of the gate stack.

In our work, we have developed a top-down approach for sub-10-nm VNW fabrication, as shown in Figure 1. Hydrogen silsesquioxane (HSQ) hardmask is patterned by electron beam lithography (EBL), followed by Cl-based reactive-ion-etching (RIE) and alcohol-based digital etch (DE). Planarization is another critical step, in which insulating layers are formed around the VNWs with good vertical location control. We have developed a method to accurately control the thickness of an HSQ film using EBL with different electron doses. Figure 2 shows the final height of HSQ as a function of e-beam dose. The insets in Figure 2 show an example of a 60-nm-thick planarized HSQ film around a 230-nm-high InAs VNW.

![Figure 1: Sub-10-nm diameter (a) InGaAs VNW and (b) GaSb VNW fabricated by RIE and DE techniques. HSQ is on top of the VNWs.](image1)

![Figure 2: Final height of HSQ film vs. e-beam dose with initial HSQ thickness of 490 nm. The insets show a 60-nm-thick planarized HSQ film (right) fabricated around a 230-nm-high InAs VNW (left).](image2)

FURTHER READING

Diamond is considered a leading candidate for harsh environment high-power electronics due to their extraordinary thermal and electrical properties. One of the many challenges facing diamond electronics is creating reliable and stable ohmic contacts to hydrogen-terminated diamond (D:H). In this work we explored a novel approach for scalable and self-aligned ohmic contacts to D:H. Our results show that using this approach stable ohmic contacts can be obtained with state-of-art contact resistance.

The diamond surface conductivity is governed by its surface termination. H-termination leads to a conductive surface, while O-termination (D:O) results in insulating diamond. The different terminations are typically obtained by exposing the diamond surface to H or O plasma (fig. 1). Since in D:H all the dangling bonds are practically passivated, it is typically hydrophobic and suffers from poor adhesion to most materials which are only weakly attached by Van der Waals forces. D:O however, is hydrophilic and can provide good adhesion. This creates a problem for ohmic contacts which usually need to be laid over a conductive surface. To overcome this issue in our approach we first pattern W contact on D:O providing good adhesion. After this, the diamond surface is exposed to the H plasma. We use W in this approach since it is one of the few metals that can withstand prolonged exposure to H plasma at elevated temperature without being damaged or go through embrittlement.

To test our approach, we fabricated four terminal TLM test structures with nano contacts. From the analysis of the data (Fig. 2), we extract the contact resistance (black markers), as well as the D:H (blue markers) as a function of contact length \(L_c\) (Fig. 1 right). Since this is a ‘side contact’, it does not follow the classical transfer length behavior obtained when Ohmic contacts are overlapping a conductive surface (Fig. 2, full line). Rather, the contact resistance is insensitive to the contact length. Notably, the sheet and contact resistance are in par with other approaches to obtain ohmic contacts to D:H.

**FURTHER READING**

Cryogenic GaN HEMT Technology for Application in Quantum Computing Electronics

Q. Xie, N. Chowdhury, M. Sánchez Lozano, A. Zubair, J. Lemettinen, I. Charaev, M. Colangelo, O. Medeiros, K. K. Berggren, T. Palacios

Sponsorship: IBM

High performance and scalable cryogenic electronics is an essential component of future quantum information systems, which typically operate below 4K. Current electronics rely on technology like CMOS (Si), or heterojunction bipolar transistor (e.g. SiGe, InP).

This work explores the use of wide band gap heterostructure electronics, specifically the AlGaN/GaN high electron mobility transistor (HEMT), for cryogenic low-noise applications. These structures take advantage of the polarization-induced two-dimensional electron gas to create a high mobility channel, hence eliminating the use of heavy doping as in the other semiconductor technologies. Epitaxially-grown GaN-on-Silicon wafers are available in large (8 inch / 200 mm) substrates, therefore making the technology an excellent candidate for scalable RF electronics in quantum computing systems.

Furthermore, the use of electrodes using superconducting materials is proposed to significantly reduce the parasitic components and therefore push the RF performance of cryogenic devices. Short-channel transistors with NbN gates of length 100 nm have been demonstrated with promising performance.

In the next step, the effect of the superconducting gate on RF characteristics of the transistors will be studied, with the eventual goal of pushing the frequency performance of these transistors to new limits. These transistors will be integrated into low noise amplifier circuits for applications in readout and control electronics at cryogenic temperature. Furthermore, the developed cryogenic GaN HEMT technology would bring us one step closer to an all-nitride integrated electronics-quantum device platform.

FURTHER READING

Quantitative Study on Current-induced Effects in an Antiferromagnetic Insulator/Pt Bilayer Film

P. Zhang, J. Finley, T. Safi, L. Liu
Sponsorship: NSF, National Institute of Standards and Technology

Electrical control and detection of magnetic ordering inside antiferromagnets have attracted considerable interests, for making next generation of magnetic random access memory with advantages in speed and density. However, a full understanding of the recent prototypical spin-orbit torque antiferromagnetic memory devices requires more quantitative and systematic study.

Here we study the current-induced switching in a canted antiferromagnetic insulator $\alpha$-Fe$_2$O$_3$, similar to previous demonstrations of antiferromagnetic memories, but make good use of its uniquely small spin flop field. We compare the current-induced Hall resistance to the field-induced one, and look into the nature of the switching. We raise the concern that the signal in these memory devices can be complicated by two neglected sources that are unrelated to spin-orbit torques, while the contributions from spin-orbit torques are much smaller than expected. This work provides a pathway towards the clear realization of a spin-orbit torque antiferromagnetic insulator memory device.

We epitaxially grew the $\alpha$-Fe$_2$O$_3$ (0001) film on $\alpha$-Al$_2$O$_3$ substrate. In Pt/$\alpha$-Fe$_2$O$_3$ bilayer, we found a typical antiferromagnetic spin Hall magnetoresistance (SMR). We performed the conventional current-induced switching in the Hall cross devices and obtained a sawtooth-like behavior. However, it remained almost unchanged under magnetic field, which means a purely resistive switching. To exclude that, we measured the angle-dependent SMR curve subject to an in-plane rotating field when applying different sensing currents. The current always tilts the Néel vector towards itself, which is quantified by two effective magnetic energy changes, with 180° and 360° angle period, respectively. Macrospin simulation based on the conventional damping-like torque cannot reproduce the results, while a newly-proposed thermo-magnetoelastic effect well explains the data. The 360° period energy change, instead, can be explained by a field-like spin-orbit torque.

FURTHER READING

Among all the possible back-end-of-line (BEOL) solutions to improve the integration density and functionality of conventional silicon circuits, 2D material devices are believed to be very promising due to their high mobility, relatively large band gaps, and atom-level thickness. These devices are beneficial for both logic integrated circuits and power electronic applications. However, the large area growth of high quality 2D material thin films and 2D material devices and achieving low contact resistance have always been challenging and hinder the development of 2D material devices and circuits.

Recently, by using Au contacts and MOCVD technique, we have fabricated back-gated MoS2 transistors on 4-inch MoS2 wafer with 200-nm channel length and have obtained excellent device performance, i.e., high on-state current of around 220 µA/µm (Figure 1) and low contact resistance of around 9.9 kΩ·µm (Figure 2). In order to have larger scale 2D materials with better quality, we are currently building a MOCVD system in EML labs to grow 2D materials, e.g., MoS2 and WSe2, on 6-inch wafers. We are also using Li-induced phase transition in the source/drain regions to further reduce the contact resistance of 2D material transistors. Moreover, top-gated MoS2 transistors with a multilayer hBN gate dielectric are also being investigated to improve the gate controllability and the mobility of the channel materials. In the very near future, we hope to demonstrate 2D material circuits, such as multiplexers, and DC-DC converters with high performance 2D material devices.

**FURTHER READING**

Ferroelectric FETs (FeFET) are promising candidates for low-power, scalable, and non-volatile memory-enabling applications such as in-memory computing, artificial intelligence (e.g., analog synapses, coupled oscillator networks, spiking neurons) and quantum computing (i.e., cryogenic memory). Ultra-thin doped HfO2 based thin-films have emerged as an attractive option for FeFETs due to precise thickness control through atomic layer deposition (ALD) and Complementary Metal Oxide Semiconductor (CMOS) compatibility. However, the design space of a FeFET-based memory that operates with a low supply voltage, a sufficient memory window, and high endurance is not well understood. In this work, we systematically investigate ferroelectric Hf$_{0.5}$Zr$_{0.5}$O$_2$ MOS capacitors to study the electrostatics of the device, which solidifies the design criteria for low voltage FeFETs.

In this study, MOS capacitors (Figure 1) are fabricated on p-Si wafers using standard CMOS processing with different ferroelectric thicknesses. The dielectric constant, $k$, of the annealed Hf$_{0.5}$Zr$_{0.5}$O$_2$ film is higher than those of HfO$_2$ and ZrO$_2$ ($k = 25$) for all thicknesses, as observed in the small signal capacitance-voltage (C-V) characteristics (Figure 2) due to the film’s orthorhombic phase. At low gate biases, the HZO film is hysteresis-free (Figure 2 inset) and shows negligible frequency dispersion, indicating a high-quality interface. At high gate bias, the thinner films show rapid increase of the capacitance, resembling the peak of butterfly-like behavior of standard ferroelectric capacitors as the net charge exceeds the critical charge required to achieve the coercive field. However, this behavior is absent in the thick HZO film, where the coercive field is higher than the breakdown field. The high dielectric constant and relatively low effective charge of the ferroelectric thin film, in combination with the ultrathin SiO$_2$ interlayer, enables the polarization switching of the thinner dielectrics. This is the first observation of polarization switching ferroelectric MOS capacitors using small-signal measurement.

These results indicate that our technology can enable FeFETs operating at 2.5 V with highly scaled dielectrics ($t_{FE} = 5$ nm) that are required for a future transistor topology. This is a significant improvement compared to state-of-the-art flash memory. However, to enable lower switching voltage FeFET, additional materials and device engineering would be required as the switching voltage weakly scales with ferroelectric thickness.
First Demonstration of GaN Vertical Power FinFETs on Engineered Substrates

A. Zubair, J. Perozek, J. Niroula, O. Aktas, V. Odnoblyudov, T. Palacios
Sponsorship: Samsung Advanced Institute of Technology

GaN vertical power Fin Field Effect Transistors (FinFET) are promising high-voltage switches for the next generation of high-frequency power electronics applications. Thanks to a vertical fin channel, the device offers excellent electrostatic and threshold voltage control, eliminating the need for epitaxial regrowth or p-type doping, unlike other vertical GaN power transistors. Vertical GaN FinFETs with 1200 V breakdown voltage (BV), 5 A current rating and excellent switching figures of merit have been demonstrated recently on free-standing GaN substrates. Despite this promising performance, the commercialization of these devices has been limited by the high cost ($50-$100/cm²) and small (~2 inch) diameter of free-standing GaN substrates. The use of GaN-on-Si wafers could reduce the substrate cost by 1000; however, the growth of the thick (~10 μm or thicker) drift layers required for kV class applications is extremely challenging on Si. Alternatively, GaN grown on engineered substrates (QST®) with a matched thermal expansion coefficient could enable low-cost vertical GaN FinFETs with thick (>10 μm) drift layers and large wafer diameters (8-12 inch). In this work, we have demonstrated a quasi-vertical GaN FinFET on engineered QST® substrates for the first time.

A conformal oxide-based planarization and etch-back technology was used for gate etching and source-to-gate spacer etching. The device demonstrates a current density of $J_{DS}=3.8 \text{ kA/cm}^2$ at $V_{GS}=1.5 \text{ V}$ and $V_{DS}=4 \text{ V}$ (Figure 2), and a maximum $g_m = 2 \text{ kS/cm}^2$ at $V_{DS}=4 \text{ V}$ when normalized with respect to the total device area (fin width and spacing between fins), a record for vertical and quasi-vertical MOSFETs on non-GaN substrates. The current density in each fin is higher than 30 kA/cm² at the same bias condition. The on-resistance is currently limited by non-ideal source contacts, as is evident in the Schottky-like behavior of the drain current at low VDS. The source contact resistance can be improved by either higher doping density or rapid thermal annealing of the metal stack after contact formation. The results are very promising for large wafer scale manufacturing and commercialization of vertical GaN power FinFETs.

**Further Reading**


▲ Figure 1: Schematic diagram of the quasi vertical Fin-FET on QST® substrate.

▲ Figure 2: Output characteristics of fabricated GaN power FinFET at different gate bias. Current is normalized to total active device area. Inset shows benchmarking of current work against state-of-the-art vertical GaN transistors on non-GaN substrate.
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Power electronics play a vital role in the technological advancement of transportation, energy systems, manufacturing, healthcare, information technology, and many other major industries. Demand for power electronics with smaller volume, lighter weight, and lower cost often motivates designs that better utilize a converter’s energy storage components, particularly magnetics. However, the achievable power densities of magnetic components inherently reduce as volume decreases, so further progress in converter miniaturization will eventually require new energy storage mechanisms with fundamentally higher energy density and efficiency capabilities.

This prompts investigation into piezoelectric energy storage for power conversion; piezoelectrics have comparatively superior volume scaling properties. While piezoelectrics have been used extensively for sensing, actuation, transduction, and energy harvesting applications, their adoption in power conversion has been more limited. Converter designs based on single-port piezoelectric resonators (PRs) report limited power and/or performance capability, but without investigation into the full realm of possible converter implementations.

In this work, we conduct a systematic enumeration and downselection of practical dc-dc converter switching sequences and topologies that best leverage PRs as their only energy storage components. In particular, we focus on switching sequences that facilitate high-efficiency behaviors (e.g., low-loss resonant charging/discharging of the PR’s input capacitance and all-positive instantaneous power transfer) with voltage regulation capability. To analyze and compare implementations, we demonstrate methods for mapping PR state trajectories across a switching cycle, imposing practical constraints on PR behavior, evaluating PR utilization, and estimating PR efficiency.

Effective use of the PR’s resonant cycle enables these converter implementations to achieve strong experimental performance with peak efficiencies >99%, even with presently commercially-available PRs. This suggests that these PR-based converters are promising alternatives to those based on traditional energy storage. With further development, PR-based converters may pave the way for high-performance converter miniaturization in applications spanning consumer electronics, biomedical implants, and flight.

FURTHER READING
The miniaturization of sensors through advancements in low-powered MEMS devices in integrated circuits has opened up new opportunities for thin film microbatteries. However, many of the available thin film battery materials require a high-temperature process that necessitates additional packaging volume, which reduces the overall energy density of these batteries. Previous research with collaborators in Singapore demonstrated an all-solid-state materials system with high volumetric capacity that exclusively utilizes CMOS-compatible (i.e., room temperature) processes. This process allows integration of these batteries directly onto CMOS circuits, thereby achieving energy densities comparable to bulk batteries for applications in distributed power supplies and integrated autonomous microsystems (Figure 1).

Additionally, the ability to deposit all components of the battery at room temperature makes it possible to fabricate these batteries on thin, flexible substrates that can be densely stacked to achieve a wide range of capacities without sacrificing their high energy density.

We have successfully demonstrated a full thin film microbattery using Ge and RuO$_2$ as anode and cathode materials, respectively, with LiPON as the solid-state electrolyte (Figure 2b). Although RuO$_2$ has traditionally been used as an anode material, it has significantly higher volumetric capacity than typical cathode materials and sufficiently high electrochemical potential versus Ge to provide an output voltage of $\approx 0.5$V at a capacity of $\approx 40 \text{Ah/cm}^3$ (Figure 2a).

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**FURTHER READING**

State Estimation, Parameter Inference, and Observability Analysis of Electrical Distribution Networks

M. J. Chon, A. Weathers, M. Polking, J. Kedzierski, D. Nezich, H. Chea, L. Racz, C. V. Thompson
Sponsorship: Lincoln Laboratories

In modern electrical power systems, distribution networks facilitate the final step of power delivery to homes and businesses. Distributed energy resources (DERs) such as Tesla powerwalls and rooftop PV systems, automated sensing devices equipped with telemetry capabilities such as micro-Phasor Measurement Units (μ-PMUs) and smart meters, and active loads, which are capable of responding to real-time pricing signals, all significantly disrupt the standard operating procedures of distribution networks. One of the primary roadblocks to successful operation and control of these systems is the lack of network observability. Due to the significant cost and effort associated with sensor deployment in ultra-large distribution networks, system operators must alternatively leverage the physical model of the network and various measurement sets to reconstruct the so-called “state” (i.e., voltage equilibrium) of the network. State estimation, therefore, is a vitally important tool for distribution system operators. Because network parameter values span many orders of magnitude and sensors are critically under-deployed, the traditional state estimation problem is severely ill-conditioned and is seldom deployed in the field.

Standard DSSE techniques rely on strong, yet potentially unjustified, regularization to combat the ill-conditioning of the problem. In this project, we represent the operation of a distribution system as a sequence of nonlinear maps that relate measurements, states, controller decisions, and operational performance. Using advanced uncertainty quantification techniques, we quantify the subspace of input perturbations whose response is practically “unobservable” at the output of each nonlinear map. These sensitivity results (which must be regathered each time state estimation is employed) guide the selection of appropriate regularization methods whose application can be probabilistically justified. We therefore carefully apply varying degrees of statistical regularization, such as Bayesian priors, and physics-based regularization to solve the state estimation problem. Further uncertainty quantification not only gauges the quality of the result, but also suggests optimal field testing and optimal placement of future deployed sensors to system operators.

Despite regularization, the Hessian used to iteratively solve the state estimation problem can still exhibit severe numerical ill-conditioning. To overcome this numerical ill-conditioning, we are developing a set of computationally efficient and numerically robust methods to invert the Gauss-Network “gain” matrix. This solution utilizes a semi-explicit LU decomposition in conjunction with a matrix series expansion (i.e., Neuman expansion) and sequential applications of the so-called Woodbury matrix identity. Homotopy methods are used to scale the measurement variances and line lengths to decrease the number of iterations needed to converge on a final solution.

FURTHER READING

Maximizing the External Radiative Efficiency of Hybrid Perovskite Solar Cells

D. W. deQuilettes, M. Laitz, R. Brenes, B. Dou, B. T. Motes, S. D. Stranks, H. J. Snaith, V. Bulović, D. S. Ginger

Sponsorship: Tata Trusts

Despite rapid advancements in power conversion efficiency (PCE) in the last decade, perovskite solar cells still perform below their thermodynamic efficiency limits. Non-radiative recombination, in particular, has limited the external radiative efficiency and open circuit voltage in the highest performing devices. We review the historical progress in enhancing perovskite’s external radiative efficiency (ERE) and determine key strategies for reaching high optoelectronic quality. Specifically, we focus on non-radiative recombination within the perovskite layer and highlight novel approaches to reduce energy losses at interfaces and through parasitic absorption. If defects are strategically targeted, it is likely that the next set of record-performing devices with ultra-low voltage losses will be achieved.

▲ Figure 1: (A) ERE and non-radiative voltage loss of a selection of pioneering perovskite devices work as a function of publication date. The red dashed line represents the threshold for achieving the next set of high ERE and low voltage loss devices. (B) Plot of perovskite PCE versus ERE and non-radiative voltage loss along with a nonlinear trendline (dashed black line) and the record GaAs solar cell. The black solid line shows the Shockley-Queisser (SQ) maximum theoretical PCE irrespective of material bandgap.

FURTHER READING

Blade Coating of Perovskite Solar Cells Toward Roll-to-roll Manufacturing

B. D. Dou, V. Bulović
Sponsorship: Tata Trusts

High efficiency combined with transformative roll-to-roll (R2R) printability makes metal halide perovskite-based solar cells the most promising solar technology to address the terawatt challenge of the future energy demand. However, translation from lab-scale deposition solution processing techniques, such as spin coating, to large-scale R2R compatible methods has been a significant challenge due to fundamental differences in coating fluid dynamics and resulting drying and crystallization processes with the different coating methods. Here we address this challenge by developing processes and device architectures with high-speed (> m min⁻¹) blade-coating (Figure 1A), which is R2R manufacturing compatible. We constructed solar cells with structure of Glass/FTO/SnO₂/FA₀.₈MA₀.₁₆Cs₀.₀₄PbBr₀.₁₆I₀.₈₄/Spiro-MeOTAD/MoOX/Ag (Figure 1B), where the SnO₂ is blade-coated at an environment of 49% relative humidity and with overall device thickness of less than 1 μm, excluding the glass substrate. We demonstrated a light-to-electricity conversion efficiency up to 17%, with open-circuit voltage of 1.112 V, short-circuit current of 22.12 mA cm⁻², and fill factor of 69.1% (Figure 1C). The application of blade-coating of SnO₂ has been a first step to show the potential of scaling highly efficient perovskite solar cells with transformative R2R compatible manufacturing techniques.

▲ Figure 1: (A) Schematic of blade coating process and blade coater. (B) The solar cell device architecture applied in this study. (C) A typical device’s current density–voltage characteristics.
All-solid-state batteries (SSBs) promise safer and higher performance energy storage than the present liquid-electrolyte Li-ion batteries. Li$_7$La$_3$Zr$_2$O$_7$ and Li$_{1+x}$Al$_{x}$Ti$_{2-x}$(PO$_4$)$_3$ are promising solid electrolytes for Li-ion SSBs. The wide electrochemical window of Li$_7$La$_3$Zr$_2$O$_7$ enables usage of a Li metal anode and high-voltage oxide cathodes. This combination makes Li$_7$La$_3$Zr$_2$O$_7$ a promising candidate for a high-capacity battery cell. Li$_{1.4}$Al$_{0.4}$Ti$_{1.6}$(PO$_4$)$_3$ has a high stability window and excellent chemical stability against moisture, enabling large-scale production with minimal cost. However, the development of SSBs in both systems is hindered mainly due to the high cathode-electrolyte interfacial resistance, which impedes the Li-ion transfer and ultimately the durability and power density. Sintering, which is necessary to get good contact between a cathode and an electrolyte, leads to the formation of detrimental phases that are insulting for Li-ion transfer. Despite the importance of the issue, only limited understanding of the interfacial chemistry exists so far. The lack of research comes from the challenges in investigating buried interfaces.

We aim to advance the understanding and control over the stability of the cathode-electrolyte interfaces. We use model systems made of thin-film cathode layers on dense electrolyte pellets (Figure 1). This approach enables us to use surface-sensitive and non-destructive techniques such as X-ray absorption near edge spectroscopy (XANES) and extended X-ray absorption fine structure (EXAFS) to study buried interfaces. Our findings show that interfacial degradation is highly dependent on the gas environment used in the sintering process (Figure 2). Annealing in O$_2$ environment does not lead to formation of a detrimental phase at the interface. In contrast, annealing in air or in CO$_2$ led to severe degradation. We attribute this to the formation of Li$_2$CO$_3$ and delithiated phases at the interface. The findings from this project will lead to identifying suitable process parameters to develop a stable cathode-electrolyte interface with good electrochemical properties.

**FURTHER READING**

Conventional schemes of panel mounting require horizontal space, on the order of 20,000 to 40,000 m² per megawatt peak (MWp), prompting us to investigate new strategies for deploying solar panels. Mounting solar photovoltaic (PV) panels vertically to the sides of existing structures, such as facades of buildings, offers one such strategy. Vertically-mounted PVs take advantage of otherwise unused vertical real estate in the built environment, with minimal additional structural reinforcement costs and no need for additional land area use. Uniquely, the peak electricity generation time of west-facing vertically-mounted PV panels occurs closer to the hour of maximum consumer power demand, allowing increased electricity generation when the same PV panels, if conventionally mounted, would generate lower amounts of power.

Keeping these advantages in mind, we identified a set of potential profitable markets in the United States (U.S.) and enumerated the technical challenges to expanding PV usage into these markets. We calculated the levelized cost of electricity (LCOE) for vertically-mounted PVs as a function of the azimuth panel; then using county-level resolution we estimated economic viability for these installations in the contiguous U.S. The LCOE calculations allow us to identify target specifications for vertical PV panels to be economically competitive when compared to the commercial grid electricity. We show that lightweight, flexible and bifacial form factors attainable with the next-generation PV technology can lead to installation cost reductions. We are developing roof-of-concept prototypes to validate our hypothesized deployment strategies.
Rocket engines miniaturized and fabricated using MEMS or other techniques have been an active area of research for two decades. At these scales, miniaturized steam injectors like those used in Victorian-era steam locomotives are viable as a pumping mechanism and offer an alternative to pressure feed and high-speed turbo-pumps. Storing propellants at low pressure reduces tank mass, and this improves the vehicle empty-to-gross mass ratio; if one propellant is responsible for most of the propellant mass (e.g., oxidizer), injecting it while leaving the others solid or pressure-fed can still achieve much of the potential gain. Previously, the principal investigator and his group built and tested ultraminiature-machined micro jet injectors that pumped ethanol and also explored liquid and, more recently, hybrid engine designs. Recent work has focused on designing and implementing a whole-engine test article that simultaneously integrates a steam injector, boiler, decomposition chamber, fuel injector and thrust chamber, that is practical to build, and that is compatible with MEMS fabrication. An axisymmetric engineering mockup in brass was built to demonstrate the feasibility of the design concept (see Figure 1). Configurations that combine electrically-driven pumps with steam injectors by, for example, using electric pumps to pump fuel or coolant and a steam injector motivated by boiled coolant to pump oxidizer are also being explored. These would allow pressurized tanks to be avoided altogether while still being compatible with miniaturization via MEMS.

![Figure 1: (left) Schematic representation of engine and (right) engineering mock-up in brass of a fully-integrated engine.](image)

**FURTHER READING**

Hafnia-filled Photonic Crystal Emitters for Mesoscale Thermophotovoltaic Energy Converters

Sponsorship: ARO, DoE

Thermophotovoltaic (TPV) systems are promising as small scale, portable generators for power sensors, small robotic platforms, and portable computational and communication equipment. In TPV systems, an emitter at high temperature emits radiation that is then converted to electricity by a low bandgap photovoltaic cell. Our group’s approach to increase both TPV power and efficiency is to use two-dimensional, hafnia-filled tantalum photonic crystals (PhCs) as emitters. These emitters consist of a 2D array of cylindrical cavities etched in tantalum and filled with hafnia (HfO2). They work by enabling efficient spectral tailoring of thermal radiation for a wide range of incidence angles; they can increase the fuel-to-electricity efficiency of our group’s propane-based TPV system from 4.3% to above 12%. However, fabricating these PhCs is difficult: while the deep cavities of the PhC must be filled as completely as possible, using atomic layer deposition to fill the cavities layer by layer leads to an uneven and thick top hafnia surface that adversely impacts the emittance. Because the PhC optical performance improves with a flatter top hafnia surface, we explore methods to planarize the top surface, in particular by depositing a sacrificial oxide layer and etching it back. With a single iteration, the average height difference between the hafnia crest and trough is reduced from about 200nm to 90nm in silicon PhC samples, suggesting a method to fabricate PhCs with improved geometry and emittance. Precise fabrication of PhC emitters can enable high TPV performance and pave the way toward portable micro-generators for off the grid applications.

FURTHER READING

In recent years, wearable technologies have emerged as a platform beyond basic functionality, such as a watch or a headphone, into highly integrated tools capable of communications, biosensing, navigation guidance, and performing financial transactions. Yet these technologies remain localized on the body in a bulky form-factor such as a smartwatch, AR glasses, or earbuds. Seamless integration of electronics over large areas into the most indispensable wearable, clothing, remains a distant goal. Forgoing conventional discrete/bulk electronics in place of emerging thin-film alternatives promises to bridge this gap.

In this project, we report integration of organic photovoltaics (OPV) into ultra-lightweight composite fabrics (Dyneema) as a first step towards realizing electronically active fabrics. The devices are fabricated on CVD-deposited ultra-thin dielectric substrates, which lend themselves for use on fabrics through transfer lamination. Employing standard thermal evaporation and RF sputtering processes, we have demonstrated fabric-integrated OPV devices with over 1% power conversion efficiencies. In an effort to realize photovoltaics with higher efficiencies that can power larger electronic devices, we are currently exploring the use of electronic polymer inks, which can be coated/printed through scalable roll-to-roll processes. Techniques developed in this project can also enable integration of other devices including displays, sensors, speakers, and actuators.

▲ Figure 1: (Left) Photograph of transfer-laminated organic photovoltaic on Dyneema composite fabric. Active area of the device is outlined in yellow, covering a total area of 13.9 square centimeters. The device has a power conversion efficiency of 1.23%. (Right) Photograph of slot-die coated organic photovoltaic inks being explored to manufacture this technology in a scalable manner at higher power conversion efficiencies. The inset shows a photograph of the slot-die tool housed in MIT.nano.
We study a novel class of motion planning problems, inspired by emerging low-power robotic vehicles, such as insect-size flyers, high-endurance autonomous blimps, and chip-size satellites for which the energy consumed by computing hardware while planning a path can be as large as the energy consumed by actuation hardware during the execution of the same path. For these new applications, we must consider the total energy of executing and computing a candidate solution to evaluate a motion plan. Figure 1 shows average actuation energy and computing energy curves for a selected robotic platform and computing platform. Here, minimizing only the actuation energy does not minimize the total energy. Instead, stopping computing earlier and accepting a higher actuation energy cost for a lower computing energy cost minimizes the total energy.

We propose a new algorithm, called Computing Energy Included Motion Planning (CEIMP). CEIMP operates similarly to other anytime planning algorithms, except it stops when it estimates further computing will require more computing energy than potential savings in actuation energy. The algorithm relies on Bayesian inference to estimate future energy savings to evaluate the trade-off between the computing energy required to continue sampling and the potential future actuation energy savings after such computation. CEIMP outperforms the average baseline of using maximum computing resources in realistic computational experiments involving 10 MIT building floor plans. On the ARM Cortex-A15, for a simulated vehicle that uses 1 Watt to travel 1 m/s, CEIMP saves 2.1-8.9x the total energy on average across floor plans compared to the baseline, translating to missions that can last 2.1-8.9x longer on the same battery. Figure 2 shows CEIMP in action; while the path returned by CEIMP is longer than the path returned by the baseline, CEIMP’s total energy is much closer to the true minimum of total energy than the baseline.

**FURTHER READING**

Enabling Low-cost Electrodes in PbS Solar Cells through a Nickel Oxide Buffer Layer

E. Wassweiler, M. Sponseller, J. Jean, A. Osherov, M. Bawendi, V. Bulović
Sponsorship: NSF GRFP, Tata-GridEdge Solar

The versatile characteristics of lead sulfide quantum dots (PbS QD) make them an attractive material to develop high-efficiency, low-cost, and flexible photovoltaics (PVs). Hole transport layers (HTLs) and electron transport layers are essential building blocks in these solar cell architectures. PbS QDs with an EDT ligand are widely used as an HTL in high-efficiency QDPVs. However, the limited compatibility of the EDT with different electrode materials prevents the continued development of QDPVs into manufacturing capable device architectures. Specifically, the dependence on gold electrodes is cost-prohibitive for depositing QDPVs on a large scale.

While gold cannot be used on a commercial scale, less expensive but more chemically reactive materials can be used. Replacing gold with aluminum or copper would cut material costs by a factor of at least 1,200.

Through the use of a nickel oxide (NiOx) buffer layer, these devices become compatible with lower-cost electrodes. As a p-type metal oxide, NiOx is a favorable HTL material with a high work function, large band gap, and film stability.

In fact, through the use of a NiOx buffer layer, power conversion efficiencies for devices with lower-cost electrodes are equivalent to their gold electrode counterparts. However, even though NiOx buffer layer devices show improved performance and stability compared to devices without NiOx buffer layers, the power conversion efficiency drops after a couple of months due to a new barrier within the device stack. Current research focuses on improving the stability of QDPVs with low cost electrodes through identifying and mitigating the barrier formation.

▲ Figure 1: Cost associated with different electrode materials.
▲ Figure 2: Comparison of JV curves between solar cells with gold and aluminum electrodes.

FURTHER READING
With Moore's law slowing down and Dennard scaling ending, energy-efficient domain-specific accelerators have become a promising direction for hardware designers to continue bringing energy efficiency improvements to data and computation intensive applications. To ensure fast exploration of accelerator design space, architecture-level energy estimators, which perform energy estimations without requiring complete hardware description of the designs, are critical to designers. However, it is hard to use existing architecture-level energy estimators to obtain accurate estimates for accelerator designs, as accelerator designs are diverse and sensitive to data patterns.

To solve this problem, we present Accelergy (Figure 1), an architecture-level energy estimation methodology. Accelergy allows the users to define their own components in their designs to allow descriptions of the diverse design space. At the same time, to reflect the energy differences brought by special data patterns, e.g., sparsity in data, Accelergy also allows the users to define special actions types related to the components. To enhance flexibility, Accelergy defines an interface to communicate with other estimators that focus on energy estimations of specific types of components in the designs (e.g., memory storage components). To illustrate the usage of Accelergy methodology, we implemented an example framework for energy estimations of deep neural network (DNN) accelerator designs. We further integrate Accelergy with Timeloop, a DNN mapping space exploration tool, to enable accurate estimation of processing-in-memory (PIM) based DNN accelerator designs. We validated the Accelergy framework on a conventional digital design Eyeriss as well as a PIM-based design, both achieving a total energy estimation accuracy of 95% and accurate energy breakdowns of various components in the designs (Figure 2).

**FURTHER READING**
Low-frequency Buckled Beam MEMS Energy Harvester

R. Xu, H. Akay, Z. Lian, H. Li, S.-G. Kim
Sponsorship: MIT-SUTD International Design Center

Vibrational energy harvesting at the MEMS scale is a unique challenge for low-frequency sources which are ubiquitous but do not operate at resonant frequencies of structures on the micro scale. It is nature's law that resonant frequency is inversely proportional to mass, which is a great challenge for micro-scale energy harvesting devices operating at low frequencies (less than 100Hz). A bi-stable buckled beam design is presented that does not rely on resonance of a MEMS structure but rather operates by snapping between buckled states at low frequencies.

A fully functional piezoelectric MEMS energy harvester is designed, monolithically fabricated, and tested. An electromechanical lumped parameter model is developed to analyze the nonlinear dynamics and to guide the design of the nonlinear oscillator-based energy harvester. Multi-layer beam structure with residual stress induced buckling is achieved through the progressive residual stress control of the deposition processes along the fabrication steps. Dynamic testing, however, demonstrated that optimizing the beam stiffness to proof mass ratio was challenging given the presence of undesired modes of vibration. A new iteration of the design was fabricated with changes to the proof mass geometry which stabilize the oscillations by reducing rotational inertia, a key variable in enhancing dynamic performance of the device.

FURTHER READING

A CMOS-based Energy Harvesting Approach for Laterally-arrayed Multi-bandgap Concentrated Photovoltaic Systems

H. Zhang, K. Martynov, D. J. Perreault
Sponsorship: ARPA-E

When high solar conversion efficiency is desired, people often adopt concentrated photovoltaic systems with multi-junction cells. However, traditional tandem structures widely used in such systems can suffer from current-mismatch effects with spectrum variations, whereas the Laterally-Arrayed Multi-Bandgap (LAMB) cell structure is a potentially higher-efficiency and lower-cost alternative.

Here we show an energy harvesting approach designed to take full advantage of the LAMB cell structure. Individual cells within a sub-module block are connected for approximate voltage-matching, and a Multi-Input Single-Output (MISO) buck converter combines the energy and performs Maximum Power Point Tracking locally. A miniaturized MISO dc-dc converter prototype is developed in a 130nm CMOS process. For 45-160mW power levels, >95% peak efficiency is achieved in a small form factor designed to fit within available space in a LAMB cell block. The results demonstrate the potential of the LAMB CPV system for enhanced solar energy capture.

Figure 1: Structure of a LAMB cell unit. An optical layer spectrally-splits and focuses direct sunlight onto multi-bandgap III-V cells, and a Si cell collects diffuse light.

Figure 2: Proposed power management structure. Each cell block comprises several LAMB cell units, and a dc-dc converter that tracks local maximum power point and combines energy generated from multiple cells into a single output. The power from individual converters can then be combined, e.g. by stacking in series.

FURTHER READING

Integrated Circuits and Systems

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An Energy-efficient Configurable Accelerator for Post-quantum Lattice-based Cryptography

U. Banerjee, T. S. Ukyab, A. P. Chandrakasan

Sponsorship: Texas Instruments

Public key cryptography protocols, such as RSA and elliptic curve cryptography, will be rendered insecure by Shor’s algorithm when large-scale quantum computers are built. Cryptographers are working on quantum-resistant algorithms, and lattice-based cryptography has emerged as a prime candidate. However, the high computational complexity of these algorithms makes it challenging to implement lattice-based protocols on low-power embedded devices. To address this challenge, we present an energy-efficient lattice cryptography processor with configurable parameters. Efficient sampling, with a SHA-3-based PRNG, provides two orders-of-magnitude energy savings; a single-port RAM-based number theoretic transform memory architecture is proposed, which provides 124k-gate area savings, while a low-power modular arithmetic unit accelerates polynomial computations. This is the first ASIC implementation to demonstrate multiple lattice-based protocols proposed for post-quantum standardization by NIST.

Figure 1 shows the architecture of our lattice cryptography processor along with the chip micrograph. Our test chip was fabricated in TSMC 40-nm low-power CMOS process and supports voltage scaling from 1.1V down to 0.68V. The cryptographic core occupies 0.28 mm² area consisting of 106k logic gates and 40.25 KB SRAM. It can be programmed with custom instructions for polynomial arithmetic and sampling and it coupled with a low-power RISC-V micro-processor to demonstrate NIST Round 2 lattice-based key encapsulation and digital signature protocols Frodo, NewHope, qTESLA, CRYSTALS-Kyber and CRYSTALS-Dilithium, achieving up to an order-of-magnitude improvement in performance and energy-efficiency compared to state-of-the-art hardware implementations. All key building blocks are constant-time and secure against timing and simple power analysis side-channel attacks. The cryptographic core can also be programmed to implement masking-based differential power analysis side-channel countermeasures, with additional computation cost, with no change to the hardware.

**FURTHER READING**

Continuous monitoring of urinary bladder volume aids management of common conditions such as post-operative urinary retention. Urinary retention is prevented by catheterization, an invasive procedure that greatly increases urinary tract infection. Ultrasound imaging has been used to estimate bladder volume as it is portable, non-ionizing, and low-cost. Despite this, ultrasound technology faces fundamental challenges limiting its usability for next generation wearable technologies. (1) Current ultrasound probes cannot cover curved human body parts or perform whole-organ imaging with high spatiotemporal resolution. (2) Current systems require skilled manual scanning with attendant measurement variability. (3) Current systems are insufficiently energy-efficient to permit ubiquitous wearable device deployment.

We are developing an energy-efficient body contour conformal ultrasound patch capable of real-time bladder volume monitoring. This system will incorporate (1) deep neural network (DNN) based segmentation algorithms to generate spatiotemporally accurate bladder volume estimates and (2) energy-efficient static random-access memory (SRAM) with in-memory dot-product computation for low-power segmentation network implementation. We aim to develop platform technology embodiments deployable across a wide range of health-monitoring wearable device applications requiring accurate, real-time, and autonomous tissue monitoring.

We are training a low-precision (pruned and quantized weights) DNN for accurate bladder segmentation. DNNs are computation-intensive and require large amounts of storage due to high dimensionality data structures with millions of model parameters. This shifts the design emphasis towards data movement between memory and compute blocks. Matrix vector multiplications (MVM) are a dominant kernel in DNNs, and In-Memory computation can use the structural alignment of a 2D SRAM array and the data flow in matrix vector multiplications to reduce energy consumption and increase system throughput.

Figure 1: The flowchart of an energy-efficient system implementing a compressed segmentation network using SRAM designed for in-memory dot product computation.

FURTHER READING
Contactless current sensing finds use in many industrial applications including power line monitoring, motor control, and electric vehicle battery management, as it provides inherent galvanic isolation over direct shunt-sensing. Magnetometers indirectly sense current through a wire by measuring the magnetic fields around it. For stray magnetic field rejection, magnetic sensors need to be placed in the air gap of a magnetic core around each wire. This solution is costly, bulky, and inconvenient to install. [1] proposes a plug-in solution with an array of integrated fluxgate (IFG) magnetometers for contactless current sensing in industrial internet of things applications.

IFG offers a better alternative than Hall sensors in terms of dynamic range (~10^5), sensitivity (200 V/T), linearity (0.1%), and low temperature drift. IFG sensors work by driving magnetic cores in and out of saturation and sensing the resulting voltage difference. They achieve high linearity by balancing external magnetic fields within the core using compensation current, which can be quite power hungry, requiring up to 1W power for a three-phase measurement. Previous IFG sensors are designed for continuous operation at high sampling rates and cannot be duty cycled efficiently due to the long convergence time needed per measurement.

The primary goal of this work is to reduce the energy needs of IFG sensors so they can be used in an array in energy constrained environments. Secondary goals are to increase the bandwidth to >100 kHz for fault detection and increase the measurement range to +/- 60 A at 0.5 cm away from the wire for a compact solution. We achieve these goals through a mixed signal front-end design to enable energy-efficient duty cycling in a bandwidth scalable fluxgate magnetic-to-digital converter. This work achieves higher measurement range, > 100 kHz bandwidth, and considerable energy savings with duty cycling from >100 kHz bandwidths for machine health monitoring to <1 kHz for power quality management.

![Figure 1: Smart connectors for contactless current sensing use an array of integrated fluxgate sensors to measure multi-phase currents. The plug-in solution offers lower cost, area, and installation effort over Hall sensing with field concentrators, but the fluxgate magnetometers are power hungry.](image1)

![Figure 2: Fluxgate sensor with two magnetic cores and three sets of coils: excitation, sense, and compensation. When excited, one core saturates before the other, producing voltage VSENSE as a function of (BIN-BCOMP). Compensation provides feedback to improve linearity.](image2)

FURTHER READING

Autonomous electronic systems smaller than the diameter of a human hair (<100 µm) presents a great opportunity for sensing applications because they allow us to interact with the environment at a much smaller scale. These microsystems could be used for example to detect chemicals in very confined spaces like the human body or microfluidic channels. Alternatively, they are small enough to be sprayed on surfaces to form distributed sensor networks or even be incorporated into fibers to make smart clothing. However, fabricating and designing such microsystems is difficult due to integration challenges and a limited power budget.

In this work, we present a 60x60x2 µm³ electronic platform, called Synthetic Cell or SynCell, that overcomes these issues by leveraging the unique integration capabilities of 2D material on an SU-8 substrate and the use of functional materials to reduce power consumption. We integrated several components on this platform including molybdenum disulfide-based transistors and chemical sensors, analog timers based on eroding germanium films, and magnetic iron pads (see Figure 1). These building blocks represent a broad set of capabilities and enable functions like computation, sensing, time tracking and remote actuation, respectively. Over the past years, we have optimized the SynCell fabrication and lift-off process and recently demonstrated a yield close to a hundred percent of fully working SynCells.

To show the potential of SynCells in confined spaces, we magnetically positioned several SynCells in a microfluidic channel to detect putrescine in a proof-of-concept experiment, see Figure 2. After we extracted them from the channel, we successfully read out the timer and sensor signal, the latter of which was amplified by an onboard transistor circuit. In the future, SynCells may be useful in a wide variety of fields, from clinical research to printable/sprayable sensor coatings.

FURTHER READING

With the growing interest in millimeter wave and terahertz (THz) electronics, there has been an associated interest in the various components that are required to realize these systems. In one such application, guided and modulated sub-THz (approximately 220-330 GHz) waves are used to transport high-rate data over backplane-scale distances. Such a scheme is attractive for a number of reasons, including broad available fractional bandwidth, compact system size (driven by smaller wavelengths compared to lower-frequency operations), relative robustness to misalignment during assembly versus optical systems, and lower transmission losses than those exhibited by copper lines for high-speed data transmission. One of the challenges associated with the development of the above link system is the realization of compact, low-loss channelizers over the wide operating bandwidth afforded by these types of lines. While waveguide-based channelizers have been demonstrated at lower bands and waveguide components are available at higher operating frequencies, they are relatively large and require more expensive packaging and interface schemes. This type of scheme would require a planar integration approach to be economically feasible.

We have demonstrated the best-in-class channelization performance on a new Intel organic packaging process over 40% fractional bandwidth and occupying up to 200x less area than competing approaches. The design makes use of a very fast circuit-EM co-design technique to overcome computational hurdles associated with full-wave, large-scale dimensional optimization to rapidly optimize the design. The work utilizes a ridged-SIW resonator design, enabled by the Intel packaging technology, provides superior performance, enables the wide operating band, and reduces the device size by 40%. This design methodology, the selected channelizer topology, and the packaging technology provide a feasible path toward ubiquitous, highly-integrated, and low-cost THz-communication systems-in-package at the board/back-plane level.

**FURTHER READING**

A CMOS-based Dense 240-GHz Scalable Heterodyne Receiving Array with Globally-accessible Phase-locked Local Oscillation Signals

Z. Hu, C. Wang, R. Han
Sponsorship: NSF, MIT-SMART

Driven by the thrust of sensor miniaturization, there is a growing interest in forming steerable beams on the chip scale, which calls for pushing the operation frequency of beam-steering systems towards the terahertz (THz) range. However, this requires disruptive changes to traditional THz receiver architectures, e.g. square-law direct detector arrays (low sensitivity and no phase information preserved) and small heterodyne mixer arrays (bulky and not scalable). The major issue that prevents the latter case from being scalable is the need of large-scale power distribution network for local oscillation signals (LO), which can be very lossy at such high frequency. Here, we report a highly scalable 240-GHz 4×8 heterodyne array achieved by replacing the LO power distributor with a network that couples LOs generated locally at each unit. Now the major challenge for this specific architecture is that each unit should fit into a tight $\lambda/2 \times \lambda/2$ area to suppress side lobes from beam forming - it makes integrating mixer, local oscillator, and antenna into a unit difficult. Our design addresses this challenge well: the highly compact units ultimately enable the integration of two interleaved 4×4 phase-locked sub-arrays in 1.2-mm$^2$.

The architecture of the entire array is shown in Figure 1(a). Its core component is a self-oscillating harmonic mixer (SOHM), which can simultaneously (1) generate high-power LO signal and (2) down-mix the radio frequency (RF) signal. Since coupling is designed to be global, LOs generated in all units are all locked to an external reference signal by phase-locking two units only. The die (Figure 1(b)) photo shows the placement of the array and the PLL. The measured sensitivity (required incident RF power to achieve SNR=1 at baseband) over 1-kHz detection bandwidth is $58\text{fW}$, which is more than 4000× improvement over state-of-the-art large-scale square-law detector arrays. Figure 2 shows that this work has pushed the boundary of THz receiver arrays in terms of scale and sensitivity.

FURTHER READING
Analog-to-digital converters (ADCs) are essential building blocks of most electronic systems as they convert analog signals into digital bits. Since the demand for digital signal processing keeps growing, researchers have focused on enhancing the ADC performance to keep up with the demand of digital processors. However, recent studies have raised a hardware security concern regarding the ADC-related security loophole, warning that private signal information can be leaked through power supply current waveforms of an ADC.

Figure 1 illustrates an example ADC power side-channel attack (PSA) scenario in sensing hardware that is acquiring a private signal (e.g., healthcare, smart home devices, industrial monitoring). By employing an encryption engine equipped with a PSA-countermeasure, an attacker is prevented from performing eavesdropping and extracting the secret key of the encryption algorithm by tapping into the power supply of the encryption engine. Also, a tamper-proof package can be used to prevent an attacker from directly tapping into the sensor output signal. However, for practical reasons such as a provision for battery replacement and a limitation on physical dimensions, the tamper-proof package may not extend to the ADC power supplies, allowing an attacker to tap into the power supply waveforms of the ADC. Due to the strong correlation between the ADC power supply current waveforms and the ADC digital outputs, an attacker can perform an ADC PSA to obtain the private signal data of the sensing hardware.

This work explores both aspects of ADC PSA: method and countermeasure with an emphasis on SAR ADCs. In this work, neural networks are used as a mapping function that converts a SAR ADC power supply current waveform into the corresponding ADC digital output. To protect a SAR ADC from the proposed PSA method, switched-capacitor circuits called current equalizers are used to decorrelate the on-chip ADC activity and the ADC power supply current waveforms. Figure 2 shows the experimental PSA results on a custom-designed SAR ADC (Figure 2c) that demonstrate the effectiveness of the proposed SAR ADC PSA method and countermeasure schemes.
Convolutional neural networks (CNNs) have become the standard for performing complex tasks such as image classification due to their high accuracy. However, they typically involve substantial computation (~10^9 multiplies and adds) to process a single image and require a large amount of storage (~10 to 100 MB) for the fixed weight parameters and intermediate output activations. This makes it challenging to process CNNs locally on edge devices with low power and low latency. To address this, we need custom hardware accelerators to exploit the high parallelism present in the computations. At the same time, they should be flexible enough to support various networks, especially as new and better networks are continuously being developed. Because of the memory constraints on edge devices, we focus on networks compressed by techniques such as Deep Compression and Trained Ternary Quantization, which quantize the weights to a small number of unique values (usually 16 or fewer).

We propose a scalable architecture for efficiently processing compressed networks by reordering the multiplications and additions. Instead of performing each multiply-and-add separately, we accumulate all the activations multiplied by the same weight together and perform the multiplication at the end. With a small number of unique weights, the number of multiplications is greatly reduced, and consequently decreasing the average energy per operation. To enable the tradeoff between accuracy and efficiency, we added reconfigurability for different weight and activation bit widths. This allows us to use shorter bit widths in applications where energy must be minimized and a drop in accuracy can be tolerated. With added support for residual connections and depthwise convolutions, our accelerator can run modern networks such as ResNet and MobileNet, enabling CNN processing for a wide range of applications on energy-constrained devices including cell phones and IoT nodes.
Simulation and Analysis of GaN CMOS Logic
J. Jung, N. Chowdhury, Q. Xie, T. Palacios
Sponsorship: MIT EECS - Texas Instruments Undergraduate Research and Innovation Scholar

There is an increasing demand for electronics that can operate in high-temperature conditions, such as spacecraft and sensors for industrial environments. A promising solution exists in electronics based on wide-bandgap materials, among which gallium nitride (GaN) stands out as a strong candidate due to its excellent material properties and potential for monolithic integration. Most current demonstrations of GaN logic are based on nMOS technology, which has a high static power consumption. GaN CMOS technology, which has lower static power consumption, is desired.

This work studies the effect of p-channel transistor performance and circuit parameters on the performance of CMOS digital logic circuits. The industry-standard MIT virtual source GaN-FET model (MVSG) was used to accurately model the behavior of the n-channel and p-channel transistors, which were fabricated on the developed GaN-complementary circuit platform. Furthermore, excellent matching was achieved between the experimental data of a fabricated CMOS logic inverter and the simulated compact models. Several building blocks of digital logic, namely, the logic inverter, multi-stage ring oscillator, and static random-access memory (SRAM) cell, were studied using the developed computer-aided design (CAD) framework. Device-circuit co-design was conducted to optimize circuit performance, using a variety of design parameters including transistor sizing and supply voltage scaling. The high temperature performance of the circuits, simulated based on experimentally observed trends of the devices, was projected. The results indicate that GaN CMOS technology based on our monolithically integrated platform has potential for a variety of use cases, including harsh-environment digital computation. This technique will be scaled up for more complex combinational and sequential logic building blocks, with the eventual goal of realizing a GaN CMOS microprocessor.

FURTHER READING
Energy-efficient SAR ADC with Background Calibration and Resolution Enhancement

H. S. Khurana, A. P. Chandrakasan, H.-S. Lee
Sponsorship: CICS

Many signals, for example, medical signals, do not change much from sample to sample most of the time. Conventional switching schemes for SAR ADCs do not exploit this signal characteristic and test each bit starting with the MSB. Previous work called least-significant-bit (LSB)-first saves energy and bit-cycles by starting with a previous sample code and searching for the remainder by testing bits from the LSB end. However, certain code transitions consume unnecessary energy, even when the code change over the previous code is small.

This work addresses this problem with a new algorithm called Recode then LSB-first (RLSB-first) that reduces the switching energy and bit-cycles required for all cases of small code change across the full range of possible previous sample codes. RLSB-first uses split-DAC to systematically encode the previous code before LSB-first. RLSB-first lowers switching energy by up to 2.5 times and uses up to 3 times fewer bit-cycles than LSB-first. In addition to creating an energy-efficient SAR ADC, this work aims to use the savings for background calibration and resolution enhancement.

▲ Figure 1: Algorithm for RLSB-first.

FURTHER READING

Deep neural networks (DNNs) are known to be vulnerable to adversarial perturbations, which are often imperceptible to humans but can alter predictions of machine learning systems; robustness against those perturbations is becoming an important design factor. A practical approach to measuring adversarial robustness of DNNs is to use the accuracy of those models on examples generated by adversarial attack methods as a proxy for adversarial robustness. However, the failure of those attack methods to find adversarial perturbations cannot be equated with being robust. In our work, we identify three phenomena that inflate accuracy against popular bounded first-order attack methods: 1) a loss function numerically becoming zero when using standard floating point representation, resulting in non-useful gradients; 2) innate non-differentiable functions in DNNs, such as ReLU activation and Max Pooling, incurring “gradient masking”; and 3) certain regularization methods used during training to induce the models to be less amenable to first-order approximation. For each case, we propose compensation methods to improve the evaluation metric for adversarial robustness. The impact of these three sources of overestimated adversarial robustness can be significant when comparing different model capacities for adversarial robustness. For example, Figure 1 shows the adversarial robustness of deep models with the same architecture but different number of neurons per layer. Compensating for these three phenomena can change the relative benefit of using larger models in terms of adversarial accuracy. Similarly, Figure 2 shows adversarial robustness when we iteratively prune weights of an over-parameterized deep model. Adversarial accuracy against the baseline attack method significantly drops as we prune the model; however, actually there is little difference between the original dense model and the sparser models in their adversarial robustness when we properly compensate for these phenomena. Therefore, it is important to rethink the metric we use before we draw conclusions on model capacities or other design factors for their adversarial robustness.

FURTHER READING

Efficient Video Understanding with Temporal Shift Module

J. Lin, C. Gan, S. Han
Sponsor: MIT-IBM Watson AI Lab, Oak Ridge National Lab

Hardware-efficient video understanding is an important step towards real-world deployment, both in the cloud and on the edge. For example, there are over $10^5$ hours of videos uploaded to YouTube every day to be processed for recommendation and ad ranking; similarly, terabytes of sensitive videos in hospitals need to be processed locally on edge devices to protect privacy. All these industry applications require both accurate and efficient video understanding.

Traditionally, a 2D convolutional neural network (CNN) is more efficient but cannot model temporal information; 3D CNN can perform spatial-temporal feature learning, but at the cost of high computation. In this paper, we propose a novel temporal shift module (TSM), which achieves 3D CNN performance at 2D cost. By shifting some of the channels bi-directionally along the temporal dimension, we can facilitate temporal reasoning in 2D CNN at the cost of zero FLOPs and zero parameters. We also propose a uni-directional TSM for online video understanding, supporting online classification and detection from a streaming video.

TSM is efficient and accurate: on temporal related datasets, we can improve the performance by double digits at almost no overhead compared to a 2D network. TSM ranks first on Something-Something leaderboard upon submission. TSM is highly scalable: it can be scaled up to 1,536 GPUs and finish the training on Kinetics in 15 minutes; it can also be scaled down to edge deployment, achieving 77 FPS on Jetson Nano and 29 FPS on Galaxy Note 8.

FURTHER READING

- J. Lin, C. Gan, and S. Han, "TSM: Temporal Shift Module for Efficient Video Understanding," in Proceedings of the IEEE International Conference on Computer Vision (pp. 7083-7093), 2019
Secure System for Implantable Drug Delivery

S. Maji, U. Banerjee, R. T. Yazicigil, S. H. Fuller, A. P. Chandrakasan
Sponsorship: Analog Devices Inc.

Recent advances in microelectronics and medical technology have enabled Internet-connected IMDs that the patients/users can control through external handheld or wearable devices. However, several proof-of-concept attacks have been demonstrated on such devices by exploiting weaknesses in authentication protocols or their implementations. While such connected implantable devices have the potential to enable many emerging medical applications such as on-command implantable drug delivery, security concerns pose a threat to their widespread deployment. To address this challenge, we present a secure low-power integrated circuit (IC) with sub-nW sleep-state power, energy-efficient cryptographic acceleration, and a novel dual-factor authentication mechanism that ensures that the ultimate security of the IMD lies in the hands of the user.

As a solution, we propose a dual-factor authentication scheme in which cryptographic authentication is supplemented with a voluntary response from the user. The voluntary response serves as a guarded action from the user; that is, it represents consent from the user for executing the desired action without causing them much inconvenience. In our protocol, we have selected a touch-based voluntary response where the user taps on their skin near the IMD. Since most implants are subcutaneous, they can easily detect the tap-pattern and authenticate using this second-factor response. Clearly, for an adversary to provide correct second-factor response to the IMD without alerting the user is difficult, which provides higher security guarantees. In addition to second-factor authentication, the human voluntary factor (human touch) is also used for waking up the system. This provides dual benefits of achieving extremely low-power wake-up and protecting against energy-drainage attacks.

Through circuit-level optimizations, energy-efficient architecture and a novel dual-factor authentication mechanism, this work demonstrates a low-power IC for securing connected biomedical devices of the near future.

FURTHER READING

Almost all real-world signals are analog. Yet most data is stored and processed digitally due to advances in the integrated circuit technology. Therefore, analog-to-digital converters (ADCs) are an essential part of any electronic system. The advances in modern communication systems including 5G mobile networks and baseband processors require the ADCs to have large dynamic range and bandwidth. Although there have been steady improvements in the performance of ADCs, the improvements in conversion speed have been less significant because the sampling clock jitter limits the speed-resolution product (Figure 1). The effect of sampling clock jitter has been considered fundamental. However, it has been shown that continuous-time delta-sigma modulators may reduce the effect of sampling jitter. But since delta-sigma modulators rely on relatively high oversampling, they are unsuitable for high frequency applications. Therefore, ADCs with low oversampling ratio are desirable for high-speed data conversion.

In conventional Nyuistrate ADCs, the input is sampled upfront (Figure 2). Any jitter in the sampling clock directly affects the sampled input and degrades the signal-to-noise ratio (SNR). It is well known that for a known rms sampling jitter the maximum achievable SNR is limited to $1/(2\pi fin \sigma t)$ where $fin$ is the input signal frequency. In an SoC environment, it is difficult to reduce the rms jitter below 100 fs. This limits the maximum SNR to just 44 dB for a 10 GHz input signal. Therefore, unless the effect of sampling jitter is reduced, the performance of an ADC would be greatly limited for high frequency input signals.

In this project, we propose a continuous-time pipelined ADC having reduced sensitivity to sampling jitter. We are designing this ADC in 16-nm FinFET technology to give a proof-of-concept for improved sensitivity to the sampling clock jitter.
Temperature sensors are extensively used in measurement, instrumentation, and control systems. A sensor that integrates the sensing element, analog-to-digital converter, and other interface electronics on the same chip is referred to as a smart sensor. CMOS-based smart temperature sensors offer the benefits of low cost and direct digital outputs over conventional sensors. However, they are limited in their absolute accuracy due to the non-ideal behavior of the devices used to design them. Therefore, these sensors require either calibration or gain/offset adjustments in the analog domain to achieve desired accuracies (Figure 1). The latter process, also called trimming, needs additional expensive test equipment and valuable production time and is a major contributor to the cost of the sensors. To enable high volume production of CMOS-based temperature sensors at low cost, it is imperative to achieve high accuracies without trimming.

This work proposes the design of a CMOS temperature sensor that uses fundamental physical quantities resilient to process variations, package stress, and manufacturing tolerances, in order to achieve high accuracies without trimming. Simulation results prove that $3\sigma$ inaccuracy of less than $1^\circ$ C can be obtained with the proposed method.

![Figure 1: System level diagram of a Smart Temperature Sensor](image-url)
Low Power Time-of-flight Imaging for Dynamic Scenes

J. Noraky, V. Sze
Sponsorship: Analog Devices, Inc.

Depth sensing is useful for many emerging applications, which include mobile augmented reality and robotics. Time-of-flight (ToF) cameras are appealing depth sensors that obtain dense depth measurements, or depth maps, with minimal latency. However, because these sensors obtain depth by emitting light, they can be power-hungry and limit the battery-life of mobile devices. To address this limitation, we present two approaches, shown in Figure 1, that reduce the power for depth sensing by leveraging the other available data: (1) when RGB images are concurrently collected, our technique reduces the usage of the ToF camera and estimates new depth maps using a previous depth map and the consecutive images; (2) when only the data from a ToF camera is available, we adaptively vary the amount of light that the ToF camera emits to infrequently obtain high-power depth maps and to use them to denoise subsequent low power ones. In the second scenario, the ToF camera is always on, but we reduce the overall amount of emitted light while still obtaining accurate depth maps.

In contrast to our previous approaches that dealt with rigid environments, our techniques here can be used for applications that operate in dynamic environments, where the ToF camera and objects in the scenes can have independent, rigid, and non-rigid motions. For dynamic scenes, we show two benefits: (1) when RGB images are concurrently collected, our algorithm can reduce the usage of the ToF camera by over 90%, while still estimating new depth maps with a mean relative error (MRE) of 2.5% when compared to depth maps obtained using a ToF camera; and (2) when only the data from a ToF camera is available, our algorithm can reduce the overall amount of emitted light by up to 81% and the MRE of the low power depth maps by up to 64%. For these techniques, our algorithms use sparse operations and linear least squares to efficiently estimate or denoise depth maps at up to real-time (e.g., 30 fps) using the CPUs of a standard laptop computer and an embedded processor. Our work taken together enables energy-efficient, low latency, and accurate depth sensing for a variety of emerging applications.

![Figure 1: We depict the different approaches we take to reduce the power of ToF imaging: (1) we use the previous depth map \(t=0\) along with the consecutive and concurrently collected RGB images to estimate a new depth map \(t=1\) without using the ToF camera, and (2) we use the consecutive infrared images (that a ToF camera collects in the process of estimating depth) to combine the data from the high power depth map \(t=0\) with that from the low power depth map \(t=1\) to increase its accuracy.]

FURTHER READING
CMOS Molecular Clock Using High-order Rotational Transition Probing and Slot-array Couplers

C. Wang, X. Yi, M. Kim, R. Han
Sponsorship: NSF, MIT Lincoln Laboratory, Texas Instruments, Kwanjeong Scholarship

Recently, chip-scale molecular clock (CSMC) referenced to sub-THz transitions of carbonyl sulfide (OCS) gas has emerged as a low-cost solution to achieve high stability with a small size. However, the long-term stability of the first CSMC is limited by the non-flat transmission baseline, which is susceptible to environmental disturbance.

In order to enhance the long-term stability, we presented a CSMC chip that enables high-order dispersion curve locking. Since Nth-order dispersion curve can be comprehended as Nth-order derivative of the OCS line profile, the baseline tilting becomes negligible with high-order dispersion curve. Also, our chip adopts a pair of slot array couplers (SAC) for low loss chip-to-waveguide connection.

Figure 1 shows the clock architecture which consists of a spectroscopic transmitter (TX), referenced to a 60 MHz voltage-controlled crystal oscillator (VCXO), and a spectroscopic receiver (RX). In order to generate the TX probing signal which is wave-length-modulated at a rate of fm=100kHz, high-accuracy, differential sine signal at fm is generated by a pair of 8bit DACs and then fed to varactors in the 57.77 GHz VCO in TX PLL2. The harmonic-rejection lock-in detector (HRLKD) is referenced to fLKREF=3fm, since the 3rd-order dispersion curve is used in this work. Figure 2 shows the structure and simulated S parameter of the SAC. The simulated loss and 3dB fractional bandwidth of the SAC are 5.2dB and 22%, respectively.

The chip was fabricated in a 65nm bulk CMOS process and its DC power consumption was 70mW. The measured Allan Deviation are 3.2×10^-10@τ=1s and 4.3×10^-11@τ=10s, respectively, and the measured magnetic sensitivity of the unshielded clock is ±2.9×10^-12/Gauss. With an on-chip temperature sensor and a 2nd-order polynomial compensation, the frequency drift over temperature range of 27~65°C is ±3.0×10^-9. This work based on very compact size and low cost demonstrates stability performance that is comparable with chip-scale atomic clocks. Its applications include 5G cellular basestations, portable navigation systems, communication and sensing under GPS-denied conditions.

FURTHER READING

FastDepth: Fast Monocular Depth Estimation on Embedded Systems

D. Wofk, F. Ma, T.-J. Yang, S. Karaman, V. Sze
Sponsorship: Analog Devices, Intel

Depth sensing is a critical function for many robotic tasks such as localization, mapping and obstacle detection. There has been a significant and growing interest in performing depth estimation from a single RGB image, due to the relatively low cost and size of monocular cameras. However, state-of-the-art single-view depth estimation algorithms are based on fairly large deep neural networks that have high computational complexity and slow runtimes on embedded platforms. This poses a significant challenge when performing real-time depth estimation on an embedded platform, for instance, mounted on a Micro Aerial Vehicle (MAV).

Our work addresses this problem of fast depth estimation on embedded systems. We investigate efficient and lightweight encoder-decoder network architectures. To further improve their computational efficiency in terms of real metrics (e.g., latency), we apply resource-aware network adaptation (NetAdapt) to automatically simplify proposed architectures. In addition to reducing encoder complexity, our proposed optimizations significantly reduce the cost of the decoder network (Figure 1). We perform hardware-specific compilation targeting deployment on the NVIDIA Jetson TX2 platform. Our methodology demonstrates that it is possible to achieve similar accuracy as prior work on depth estimation, but at inference speeds that are an order of magnitude faster (Figure 2). Our network, FastDepth, runs at 178 fps on a TX2 GPU and at 27 fps when using only the TX2 CPU, with active power consumption under 10 W.

Figure 1: Impact of optimizations on our lightweight encoder-decoder network architecture for depth estimation. Our approach achieves significant reduction in inference runtime of both the encoder and the decoder. Stacked bars represent the encoder-decoder breakdown; total runtimes are listed above the bars.

Figure 2: Accuracy vs. runtime (in fps) on an NVIDIA Jetson TX2 GPU for various depth estimation algorithms. Top right represents desired characteristics: high throughput and high accuracy. Our work is an order of magnitude faster than prior work, while maintaining comparable accuracy.

Further Reading

Design Considerations for Efficient Deep Neural Networks in Processing-in-memory Accelerators

T.-J. Yang, V. Sze
Sponsorship: MIT, MIT-IBM Watson AI Lab, MIT Quest for Intelligence, NSF E2CDA 1639921

Deep neural networks (DNNs) deliver state-of-the-art accuracy on a wide range of artificial intelligence tasks at the cost of high computational complexity. Since data movement tends to dominate energy consumption and can limit throughput for memory-bound workloads, processing in memory (PIM) has emerged as a promising way for processing DNNs. Unfortunately, the design of efficient DNNs specifically for PIM accelerators has not been widely explored. In this work, we highlight the key differences between PIM and digital accelerators and summarize how these differences need to be accounted for when designing DNNs for PIM accelerators. The key design considerations include (1) resilience to circuit and device non-idealities, which affect accuracy; (2) data movement of feature map activations, which affects energy consumption and latency; and (3) utilization of the memory array, which affects energy consumption and latency. We examine the use of PIM accelerators on 18 DNNs published since 2012 for image classification on the ImageNet dataset to highlight the importance of the various design considerations. Our experiment results show that the common principles used to design efficient DNNs for digital accelerators (e.g., making a DNN deeper with smaller layers) may not suit PIM accelerators. Therefore, we need to rethink how to design efficient DNNs for PIM accelerators.

FURTHER READING

The increasing demands for low-cost, compact, and high-resolution radar systems have driven the operation frequency to terahertz due to the shorter wavelength and larger bandwidth. However, conventional single-transceiver frequency-modulated continuous-wave (FMCW) radar chips provide only limited signal bandwidth, especially when implemented using Complementary metal–oxide–semiconductor (CMOS) technologies with low $f_T$ and $f_{max}$. Therefore, prior THz integrated radars are based on compound semiconductors and have severely degraded performance near the band edges. That not only limits their applications in high-accuracy scenarios but also creates tradeoffs between bandwidth and detection range.

To avoid such limitations, we adopt a frequency-comb-based scalable architecture using a paralleled transceiver array as shown in Figure 1. The concept of the FMCW comb radar is illustrated as a wideband chirp signal is divided into $N$ identical segments that sweep simultaneously using an array of transceivers with equally-spaced carrier frequencies. Each transceiver has its own on-chip antenna, and the received echo signal is mixed with the transmitted signal to generate an IF output. The presented high-parallelism scheme offers several advantages over single-transceiver radars. Firstly, it achieves scalable bandwidth extension and enables implementations in less advanced technologies as well as flatter frequency responses across the entire operation band. Secondly, the flat frequency response also leads to higher linearity of the equivalent chirp signal. Thirdly, the SNR of comb radar is improved by $N$ for a given total detection time.

Implemented in a 65-nm bulk CMOS process, a five-transceiver radar chip is prototyped with seamless coverage of the entire 220-to-320GHz band as shown in Figure 2. Across the total chirp bandwidth of 100GHz, $0.6\text{dBm}/20\text{dBm}$ (with/without lens) multi-channel-aggregated EIRP with $8.8\text{dB}$ output power fluctuation, and $22.8\text{dB}$ minimum RX noise figure are achieved. With all five channels stitched together, 2.5-mm separation of two objects is clearly detected. This chip has an area of $5\text{mm}^2$ and consumes $840\text{mW}$ of power. This is the first demonstration of THz radar in CMOS process, and a record FMCW bandwidth is achieved.

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**FURTHER READING**

Gallium nitride is a promising candidate for high-temperature applications. However, despite the excellent performance shown by early high-temperature prototypes, several issues in traditional lateral AlGaN/GaN HEMTs could cause early degradation and failure under high-temperature operation (over 300°C). These include ohmic degradation, gate leakage, buffer leakage, and poor passivation. Additionally, enhancement-mode HEMTs are preferred from the application point of view because they reduce the circuit complexity and cost. At the same time, the two-dimensional electron gas induced by AlGaN/GaN heterostructures makes HEMTs naturally depletion-mode devices.

Devices capable of high-temperature operation were demonstrated by combing gate injections transistors (GITs) with ion-implanted refractory metal contacts. A self-aligned gate-first process, together with an etch-stop process, was developed and optimized to improve fabrication efficiency and device uniformity for large-scale integration. Basic logic building blocks including inverters, a NAND gate, a NOR gate, SRAM, and a ring oscillator have been demonstrated and characterized at both room temperature and high temperature (300°C).

▲ Figure 1: (a) Voltage transfer curves of 29 different devices on a single sample at room temperature; (b) Transfer characteristics of 16 different devices on a single sample at room temperature.

▲ Figure 2: Output signals of 5- and 7-stage ring oscillators from room temperature to 300°C. The voltage amplitude of the oscillation is limited by the impedance mismatch between the oscillator and the oscilloscope.
One of the greatest challenges facing society is addressing the complexities of big picture, system-level, interdisciplinary problems in a holistic way. Human designers, architects, and engineers have come to rely on steadily improving computational tools to design, model, and analyze their systems of interest. At this stage one might ask several questions: “How could we teach junior engineers, architects, and scientists to design complex systems successfully without spending years on job training? Could we also assist human experts to minimize the probability of failure by leveraging recent developments in artificial intelligence (AI) and big data?” While the resurgence of AI and machine learning suggest ways to even more fully automate downstream tasks in the design process, we propose to go up-stream of design, where all the key concepts are determined. Could machine intelligence help this early stage of designing beyond routine design and the optimization of pre-specified goals toward the generation of good, novel designs?

To capture the benefit of machine learning for design, the information and knowledge embodied in design must be represented in a method that machines can understand, memorize, and retrieve, with the goal of enhancing the practice of design. Preliminary investigation has shown how Natural Language Processing (NLP) models can be applied to accurately estimate design metrics such as functional independence based solely on descriptions of different design cases, as shown in Figure 1. With a framework for representing design knowledge, machines can effectively augment the work of human designers at the early stages of the design process.

![Figure 1: Descriptions of faucet design can be used to estimate functional independence.](image)

**FURTHER READING**

Partition WaveNet for Deep Modeling of Automated Material Handling System Traffic
D. Amirault, D. S. Boning

The throughput of a modern semiconductor fabrication plant depends greatly on the performance of its automated material handling system. Spatiotemporal modeling of the dynamics of a material handling system can lead to a multipurpose model capable of generalizing to many tasks, including dynamic route optimization, traffic prediction, and anomaly detection. Graph-based deep learning methods have enjoyed considerable success in other traffic modeling domains, but semiconductor fabrication plants are out of reach because of their prohibitively large transport graphs. In this report, we consider a novel neural network architecture, Partition WaveNet, for spatiotemporal modeling on large graphs. Partition WaveNet uses a learned graph partition as an encoder to reduce the input size combined with a WaveNet-based stacked dilated 1D convolution component. The adjacency structure from the original graph is propagated to the induced partition graph. We discuss the motivation for framing our problem as a supervised learning task instead of a reinforcement learning task, as well as the benefits of Partition WaveNet over alternative neural network architectures. We evaluate Partition WaveNet on data from a simulated and a real semiconductor fabrication plant. We find that Partition WaveNet outperforms other spatiotemporal networks using network embeddings or graph partitions for dimensionality reduction.
Efficient AutoML with Once-for-all Network

H. Cai, C. Gan, T. Wang, Z. Zhang, S. Han
Sponsorship: NSF, MIT-IBM Watson AI Lab, Google Research Award, AWS Machine Learning Research Award

We address the challenging problem of efficient inference across many devices and resource constraints, especially on edge devices. Conventional approaches either manually design or use neural architecture search (NAS) to find a specialized neural network and train it from scratch for each case, which is computationally prohibitive (causing CO2 emission as much as 5 cars’ lifetime) and thus unscalable. In this work, we propose to train a once-for-all (OFA) network that supports diverse architectural settings by decoupling training and search, to reduce the cost. We can quickly get a specialized sub-network by selecting from the OFA network without additional training. To efficiently train OFA networks, we also propose a novel progressive shrinking algorithm, a generalized pruning method that reduces the model size across many more dimensions than pruning (depth, width, kernel size, and resolution). It can obtain a surprisingly large number of sub-networks that can fit different hardware platforms and latency constraints while maintaining the same level of accuracy as training independently.

On diverse edge devices, OFA consistently outperforms state-of-the-art (SOTA) NAS methods (up to 4.0% ImageNet top1 accuracy improvement over MobileNetV3, or same accuracy but 1.5x faster than MobileNetV3, and 2.6x faster than EfficientNet w.r.t measured latency) while reducing GPU hours and CO2 emission by many orders of magnitude. In particular, OFA achieves a new SOTA 80.0% ImageNet top1 accuracy under the mobile setting (<600M MACs).

OFA is the winning solution for the 3rd Low Power Computer Vision Challenge (LPCVC, classification DSP track) and the 4th LPCVC (both classification track and detection track).

FURTHER READING

Robustness Verification and Defense for Tree-based Machine Learning Models

H. Chen, D. S. Boning
Sponsorship: MIT-SenseTime Alliance (MIT Quest for Intelligence)

Although adversarial examples and model robustness have been extensively studied in the context of linear models and neural networks, research on this issue in tree-based models is still limited, despite the prevalence of tree-based models in manufacturing and other domains. In this work, we develop a novel algorithm to learn robust trees, as well as an efficient algorithm to evaluate the robustness of a tree-based model.

Our first algorithm aims to optimize the performance under the worst-case perturbation of input features, which leads to a max-min saddle point problem. Incorporating this saddle point objective into the decision tree building procedure is nontrivial due to the discrete nature of trees—a naive approach to finding the best split according to this saddle point objective will take exponential time. To make our approach practical and scalable, we approximate the inner minimizer in this saddle point problem and present implementations for classical information gain-based trees as well as state-of-the-art tree boosting models such as XGBoost. As demonstrated in Figure 1, experimental results on real world datasets demonstrate that the proposed algorithms can substantially improve the robustness of tree-based models against adversarial examples.

Formal robustness verification of decision tree ensembles involves finding the exact minimal adversarial perturbation or a guaranteed lower bound, which is NP-complete in general. We show that for tree ensembles, the verification problem can be cast as a max-clique problem on a multipartite graph with bounded boxicity. For low dimensional problems when boxicity can be viewed as constant, this reformulation leads to a polynomial time algorithm. For general problems, by exploiting the boxicity of the graph, we develop an efficient multi-level verification algorithm that can give tight lower bounds on the robustness of decision tree ensembles while allowing iterative improvement and anytime termination. As in Figure 2, our algorithm is much faster than a previous approach that requires solving mixed integer linear programming (MILP) and can give tight robustness verification bounds on large models with one thousand deep trees.

Figure 1: Average distortion of the minimum adversarial examples for robust tree-based models in this work and natural tree-based models. Larger values mean better robustness.

Figure 2: Average distortion and per example running time of our method on a 1000-tree robust GBDT model trained with MNIST 2 vs. 6.

FURTHER READING

Exploration of unknown environments is embedded in many robotics applications: search and rescue, crop survey, space exploration, etc. The central problem an exploring robot must answer is “where should I move next?” The answer should balance travel cost with the amount of information expected to be gained about the environment. Traditionally, this question has been answered by a variety of heuristics that provide no guarantees on their exploration efficiency. Information-theoretic methods can produce an optimal solution, but until now they were thought to be computationally intractable.

In our recent work we describe the Fast Continuous Mutual Information (FCMI) algorithm, which computes the information-theoretic exploration metric efficiently. FCMI takes as input an incomplete occupancy map like the one shown in Figure 1, where white pixels indicate free space, black pixels indicate occupied space, and gray pixels indicate unknown space. It then returns an information surface as shown in Figure 2, where the brightness of each pixel indicates how much information is expected to be gained by exploring at that location. The algorithm also works on multi-resolution or 3-dimensional maps. FCMI has a lower asymptotic complexity than existing methods and our experiments demonstrate that it is hundreds of times faster than the state-of-the-art for practical inputs.

The key insight that enables FCMI is to consider the occupancy map as a continuous random field rather than a discrete collection of cells. This reveals a nested information structure that makes it possible to recursively reuse computation from one map location in adjacent locations. The continuous structure also provides more general insights that are relevant to any occupancy mapping system.

For practical map sizes, FCMI runs in seconds on a single threaded laptop CPU which is well within the timing constraints for most robotic applications. It provides considerable savings to energy constrained systems by reducing both the exploration travel cost and the computation cost. FCMI is also highly parallelizable and suited for a rapid, low energy, embedded implementation.

**FURTHER READING**

On the Use of Deep Learning for Retrieving Phase from Noisy Inputs in the Coherent Modulation Imaging Scheme

I. Kang, F. Zhang, G. Barbastathis
Sponsorship: IARPA RAVEN, MIT-SUSTech, NSF China, KFAS

Low-dose light imaging is of significance in many cases when minimal radiation exposure of samples is desired. In biological imaging, high-dose light may induce phototoxic effects at the cost of larger signal-to-noise ratio (SNR). In particle imaging, for instance, imaging integrated circuits (IC) with high-power beam leads to destructive side-effects, e.g., heat-induced deformation. However, quantum nature of photon detection influences and degrades the quality of intensity measurements, and on top of the Poisson statistics, other types of noise sources, e.g., thermal or readout noise, add up.

Deep neural networks (DNNs) have been used for retrieving phase information from noisy intensity measurements. Nonetheless, the ill-posedness of the inversion problem, governed by a physical system design, could not be sufficiently addressed when the DNN alone was used. Due to the ill-posedness of the system, residual artifacts remained in reconstructions, thus a decrease in image fidelity. Therefore, we suggest the application of random phase modulation on an optical field, also known as a coherent modulation imaging (CMI) scheme, along with the DNNs as a method of reconstruction.

In this work, we provide both quantitative and qualitative results that unwanted artifacts in reconstructions are largely removed in the coherent modulation imaging scheme under low-light conditions in conjunction with the DNNs. Here, phase extraction neural network (PhENN), which is an encoder-decoder DNN architecture based on ResNet specifically optimized for phase retrieval tasks, was used as a design of the DNN.

FURTHER READING

As the size of integrated circuits continue to shrink, variations in their fabrication processes become more significant, hindering their electrical performances and yields. One such wafer-scale variation occurs in ion implantation processes, where an ion beam implants charged particles into a substrate. As the beam is scanned across the wafer, its shape and intensity often change, resulting in a non-uniform implantation. This effect can be compensated for by adjusting the speed of the ion beam as it moves across the wafer; however, in order to do so, the dynamics of the ion beam shape must be known.

Our work focuses on using Bayesian optimization, a form of reinforcement learning, to rapidly learn how the beam shape changes, and to optimize the beam speeds in order to reduce non-uniformities. Here, we capture our knowledge of the beam shapes by treating its intensities as multivariate, normally distributed, random variables. After observing new implantations, we then use this framework to update our belief of the beam shapes, then solve for a new set of scan speeds which result in our desired profile under this updated model. We then continue this process until we converge to our desired profile. After this initial tuning, the same tuning algorithm continues to run during normal operation. Implantation measurements are periodically made, the model is updated using these measurements, and any corrections to the scan speeds are made in order to maximize uniformity. This process allows us to both quickly tune a new implantation recipe, while also allowing us to learn and compensate for any changing conditions in the tool.

Figure 1: Image showing how the beam shape changes as a function of wafer position (A) and resulting implantation using constant beam speed (B).
A Mutual Information Accelerator for Autonomous Robot Exploration

P. Z. X. Li, S. Karaman, V. Sze
Sponsorship: AFOSR YIP, NSF

Robotic exploration problems arise in various contexts, ranging from search and rescue missions to underwater and space exploration. In these domains, exploration algorithms that allow the robot to rapidly create the map of the unknown environment can reduce the time and energy for the robot to complete its mission. Shannon mutual information (MI) at a given location is a measure of how much new information of the unknown environment the robot will obtain given what the robot already know from its incomplete understanding of the environment. In a typical exploration pipeline, robot starts with an incomplete map of the environment. At every step, the robot computes the MI across the entire map. Then, the robot can select the location with the highest mutual information for exploration in order to gain the most information about the unknown environment.

However, on the CPUs and GPUs typically found on mobile robotic platforms, computing MI using the state-of-the-art Fast Shannon Mutual Information (FSMI) algorithm across the entire map takes more than one second, which is too slow for enabling fast autonomous exploration. As a result, the emerging literature considers approximation techniques, and many practitioners rely on heuristics that often fail to provide any theoretical guarantees.

To eliminate the bottleneck associated with the computation of MI across the entire map, we propose a novel multicore hardware architecture (Figure 1) with a memory subsystem that efficiently organizes the storage of the occupancy grid map and an arbiter that effectively resolves memory access conflicts among MI cores so that the entire system achieves high throughput. In addition, we provide rigorous analysis of memory subsystem and arbiter in order to justify our design decisions and provide provable performance guarantees. Finally, we thoroughly validated the entire hardware architecture by implementing it using a commercial 65nm ASIC technology (Figure 2).

FURTHER READING
The recent progress in novel hardware/software co-optimizations for machine learning has led to tremendous improvement of the efficiency of neural networks. Nevertheless, the energy efficiency is still orders of magnitude lower than biological counterpart – the brain. Digital CMOS architecture has inherent limitations for deep learning applications due to their volatile memory, spatially separated memory and computation, and the lack of connectivity between nodes. Crossbar arrays of non-volatile memory devices, able to perform simple operations (e.g. bit multiplication), can potentially achieve a 30000× improvement in energy efficiency. State-of-the-art analog “synaptic” devices based on resistive memories suffer from stochastic, asymmetric, and non-linear weight updates, detrimental to training accuracy. Electrochemical ionic devices have been shown to be fast, energy efficient, and exhibit symmetric, linear weight updates. However, electrolytes used for the electrochemical reaction are often CMOS incompatible and suffers from scalability.

Here we propose a new transistor-based analog synapse, consisting of a proton-doped SiO2 gate oxide which electrostatically modifies the threshold voltage of the semiconductor channel, tuning the channel conductance (Figure 1). Non-volatility is maintained by trapping of protons in the oxide. Due to electrostatics, we expect to observe a symmetric and linear shift in threshold voltage, leading to linear weight updates. We study the proton diffusion and electrostatic effects through device simulation via Silvaco Atlas and analytical modeling. Simulations show a threshold voltage shift of the MOS gate stack due to the presence of ions in the gate oxide (Figure 2). We fabricate n-Si/ALD SiO2/Al MOS capacitor and to demonstrate the feasibility of our ionic device. We observe that the MOS gate stack exhibits hysteretic behavior below 2V, indicating non-volatility and low-voltage operation. The results of this work will shed light on the feasibility of simple CMOS-compatible ionic devices for the next generation of neural network hardware accelerators.

▲Figure 1: All inputs are based on simple square pulses. 1. Programming input pulse pushes protons toward semiconductor, changing device to a new state. 2. Threshold voltage VT shifts. 3. For a given input voltage Vin, the conductance of the device (measured by output current) changes based on state of device.

▲Figure 2: a. Capacitance-voltage measured on fabricated MOS gate stack. b. Device simulation of MOS gate stack doped with protons shows a threshold voltage shift. Effect is stronger with increasing implantation dose. c. Diagram of MOS structure.
Efficient 3D Deep Learning with Point-voxel CNN

Z. Liu, H. Tang, Y. Lin, S. Han
Sponsorship: MIT Quest for Intelligence, MIT-IBM Watson AI Lab, Samsung, Facebook, SONY

3D deep learning has received increased attention thanks to its wide applications: e.g., AR/VR and autonomous driving. These applications need to interact with people in real time and therefore require low latency. However, edge devices (such as AR/VR headsets and self-driving cars) are tightly constrained by hardware resources and battery. Previous work processes 3D data using either voxel-based or point-based NN models. However, both approaches are computationally inefficient. The computation cost and memory footprints of the voxel-based models grow cubically with the input resolution, making it memory-prohibitive to scale up the resolution. As for point-based networks, up to 80% of the time is wasted on structuring the sparse data which have rather poor memory locality, not on the actual feature extraction.

To this end, we propose Point-Voxel CNN (PVCNN) that represents the 3D input data as point clouds to take advantage of the sparsity to reduce the memory footprint, and leverages the voxel-based convolution to obtain the contiguous memory access pattern (Figure 1). Evaluated on semantic and part segmentation datasets, it achieves a much higher accuracy than the voxel-based baseline with 10× GPU memory reduction; it also outperforms the state-of-the-art point-based models with 7× measured speedup on average (Figure 2). We validate its general effectiveness on 3D object detection: Frustum PVCNN outperforms Frustum PointNet++ by up to 2.4% mAP with 1.8× measured speedup and 1.4× GPU memory reduction.
Learning Human-environment Interactions Using Scalable Functional Textiles

Y. Luo, W. Matusik, T. Palacios

Living organisms extract information and learn from the surroundings through constant physical interactions. For example, humans are particularly receptive to tactile cues (on hands, limbs, and torso), which enable the performing of complex tasks like dexterous grasp and locomotion. Observing and modeling interactions between humans and the physical world are fundamental for the study of human behavior, healthcare, robotics, and human-computer interactions. However, many studies of human-environment interactions rely on more easily observable visual or audible datasets because it is challenging to obtain tactile data in a scalable manner. Recently, Sundaram et al. coupled tactile-sensing gloves and machine learning to uncover signatures of the human grasp. However, the recording and analysis of whole-body interactions remain elusive, as this would require large-scale wearable sensors with low cost, dense coverage, conformal fit, and minimal presence to permit natural human activities.

We present a textile-based tactile learning platform that enables researchers to record, monitor, and learn human activities and the associated interactions. Realized with inexpensive piezoresistive fibers (0.2 USD/m) and automated machine knitting, our functional textiles offer dense coverage (> 1000 sensors) over large complex surfaces (> 2000 cm²). Further, we leverage machine learning for sensing correction, ensuring that our system is robust against potential variations from individual receptors. To validate the capability of our sensor, we capture diverse human-environment interactions (> 1,000,000 tactile frames) and demonstrate that machine learning techniques can be used with our data to classify human activities, predict whole-body poses, and discover novel motion signatures. This work opens new possibilities in wearable electronics, healthcare, manufacturing, and robotics.

FURTHER READING

Automated Fault Detection in Manufacturing Equipment Using Semi-supervised Deep Learning

D. Martin, D. Boning, J. Lang
Sponsorship: Harting Technology Group, Lam Research

Our project investigates the use of semi-supervised deep learning systems for automated fault detection and predictive maintenance of manufacturing equipment. Unexpected equipment faults can be highly costly to manufacturing lines, but data-driven fault detection systems often require a high level of domain-specific expertise to implement as well as continued human oversight. To this end, we are developing and testing general-purpose fault detection systems that require minimal labeled data.

Our system trains deep autoencoders to function as a non-linear compression algorithm for sensor readings from manufacturing equipment. The compressed sensor signals are used as a proxy for the equipment's hidden state, and the reconstruction error is used to detect unexpected behavior. The compressed representation and reconstruction error are combined to provide a robust anomaly score. Instances in time with the highest anomaly score are then flagged to be labeled by a human operator as faulty or nominal. With sparsely labeled faults, the system then uses Gaussian mixture models to classify different types of errors and predicts future faults by monitoring parameter drift towards known fault states. Our system is currently being trained to detect failed runs on a plasma etcher (used for integrated circuit fabrication) using internal sensors that take voltage, current, pressure, and temperature readings. In preliminary tests, the system was able to correctly detect 88% of failed etching runs and identify specific markers in different signals indicative of faults. For example, a failure mode of the plasma etcher involves an abnormally high temperature (Figure 1). Without any labeled errors, the system flagged the higher temperatures as possibly indicative of faults (Figure 2).

We are currently testing the system on a wider range of applications, including estimating wear of milling machine cutting tools and predicting the risk of breakage. We are also developing prototypes of contactless voltage/current sensors that can easily be retrofitted onto older machinery to test the efficacy of fault detection systems using only external power draw.

▲Figure 1: Temperature sensor reading over 100 etching runs. Failed etches are shown in red, and successful runs are shown in blue.
▲Figure 2: System score for nominal temperature sensor readings with predicted anomalies shown in red.
There is a growing interest in using specialized neuromorphic hardware for artificial neural network applications such as image and speech processing, which require significant computational resources. These neuromorphic devices show promise for reducing the demands of such applications by increasing speed and decreasing power consumption compared to current software-based methods. One approach to achieving this goal is through oxide thin film resistive switching devices arranged in a crossbar array configuration. Resistive switching can mimic several aspects of neural networks, such as short- and long-term plasticity, via the dynamics of switching between multiple analog conductance states-dominated by the creation, annihilation, and movement of defects within the film (such as oxygen vacancies). These processes can be stochastic in nature and contribute significantly to device variability, both within and between individual devices.

Our research focuses on reducing the variability of the set/reset voltages and enhancing control of the conductance state with voltage pulsing using model systems of HfO2 grown on Nb:SrTiO3 substrates through the control of film growth and processing parameters. We show that depending on the growth temperature, substrate orientation, and substrate surface treatment, devices can exhibit forming-free switching or forming voltages ranging from 4 to 7 V. Forming-free devices show lower variability in the high and low conductance states but have a lower on/off conductance ratio. We rationalize these results using film microstructure information obtained from 2D X-ray diffraction and cross-sectional transmission electron microscopy. This work provides a significant step towards controlling the mechanisms behind device variability and achieving devices that meet the strict requirements of neuromorphic computing.

**FURTHER READING**

Variational Inference for Model-free Simulation of Dynamic Systems with Unknown Parameters

Sponsorship: MIT-IBM Watson AI Lab (MIT Quest for Intelligence)

Complex physical, biological, and engineering processes can be modelled using dynamic systems with few parameters. However, in real-world applications including manufacturing, it is possible to encounter systems for which the dynamics are not well understood and identifying the parameters is challenging.

“Model-free” approaches aim to learn the dynamics of the system from data. Classical statistical models assume the dynamics are linear to make the inference analytically tractable. Extension to nonlinearity usually requires partial knowledge about the system. Our goal is to achieve modeling of nonlinear dynamic systems purely by using data with the strength of deep learning.

In this work, we formulate the learning task as variational inference by considering the unknown parameters as random variables. Then, we use two recurrent neural networks and a feedforward network as the variational autoencoder to learn an approximate posterior distribution. The first recurrent neural network is a pre-trained encoder that encodes the input into a dense representation. Then, the feedforward network transforms the representation into the posterior distribution. Finally, the second recurrent neural network receives samples from the posterior distribution to predict the mean and variance of the output. Loss functions include pretraining loss, reconstruction loss, and KL divergence loss with regard to the prior. Figure 1 gives an overview of our model.

The numerical experiments show that the proposed model produces a more accurate simulation than the standard recurrent neural networks, especially when the Monte Carlo method is applied to perform multiple-step simulations. In addition, by analyzing the learned posterior distribution, we show that our approach can correctly identify the number of underlying parameters.

![Figure 1: Overview of our variational autoencoder. \( x_i \) is the input, and symbols with hats are outputs of the model. The posterior distribution represents the random variables of the underlying parameters.](image)

**FURTHER READING**

SpArch: Efficient Architecture for Sparse Matrix Multiplication
Z. Zhang*, H. Wang*, S. Han, W. J. Dally
(*Equal Contributions)
Sponsorship: NSF, DARPA

Generalized sparse matrix-matrix multiplication (SpGEMM) is the key computing kernel for many algorithms such as compressed deep neural networks. However, the performance of SpGEMM is memory-bounded on the traditional general-purpose computing platforms (CPU, GPU) because of the irregular memory access pattern and poor locality brought by the extremely sparse matrices. For instance, the density of Twitter’s adjacency matrix is as low as 0.000214%. Previous accelerator OuterSPACE proposed an outer product method that has perfect input reuse but poor output reuse due to enormous partial matrices, thus achieving only 10.4% of the theoretical peak.

Therefore, we propose SpArch (HPCA’2020) to jointly optimize input and output data reuse. We obtain input reuse by using the outer product and output reuse by on-chip partial matrix merging (Figure 1).

We first design a highly parallelized merger to pipeline the two computing stages, Multiply and Merge. However, the number of partial matrices can easily exceed the on-chip merger’s parallelism and incurs even larger DRAM access. We thus propose a condensed matrix representation for the left input matrix, where all non-zero elements are pushed to the left, forming much denser columns and fewer partial matrices. Unfortunately, the condensed representation can still produce more partial matrices than the merger’s parallelism. Since the merge order impacts DRAM access, we should merge matrices with fewer non-zeros first. To this end, we design a Huffman tree scheduler to decide the near-optimal merge order of the partial matrices. Finally, we propose a row prefetcher to prefetch rows of the right matrix and store to a row buffer, thus improving the input reuse.

We evaluate SpArch on real-world datasets from SuiteSparse, SNAP, and rMAT, achieving 4×, 19×, 18×, 17×, and 1285× speedup and 6×, 164×, 435×, 307×, and 62× energy saving over OuterSPACE, MKL, cuSPARSE, CUSP, and ARM Armadillo, respectively. Figure 2 shows the speedup breakdown of SpArch over OuterSPACE.

**FURTHER READING**
Transformers have been widely used in Natural Language Processing (NLP) tasks, providing a significant performance improvement over previous convolutional and recurrent models. Nevertheless, transformers cannot be easily deployed in mobile/edge devices due to their extremely high cost of computation. For instance, to translate a sentence with only 30 words, a Transformer-Big model executes 13G Mult-Adds and takes 20 seconds on Raspberry Pi 4, making real-time NLP impossible.

We found two critical phenomena that impact the transformer’s efficiency: (1) FLOPs cannot reflect real latency and (2) efficient model architecture varies for different hardware. The reason is that for different hardware, the latency influencing factors differ a lot. For example, the embedding size has a large impact on Raspberry Pi but can hardly influence GPU latency.

Inspired by the success of neural architecture search (NAS), we propose to search for hardware-aware transformers (HAT, ACL’2020) by directly involving hardware latency feedback in the design loop (Figure 1).

Hence, we do not need FLOPs as a latency proxy and can search hardware-specific models. We first construct a large search space with two features: (i) arbitrary encoder-decoder attention to allow all decoder layers to attend to multiple and different encoder layers and (2) heterogeneous layers to let different layers have different architectures. To conduct a low-cost search, we first train a SuperTransformer, which contains many Sub-Transformers with weight-sharing. Then we perform an evolutionary search in the Super-Transformer to find the best SubTransformers under hardware latency constraints.

We evaluate our HAT with three translation tasks on Raspberry pi ARM CPU, Intel CPU, and Nvidia GPU. HAT achieves up to 3× speedup and 3.7× smaller size over the conventional Transformer-Big model (Figure 2). With 10000× less search cost, HAT outperforms the Evolved Transformer with 2.7× speedup and 3.6× smaller size. Therefore, HAT enables efficient NLP on mobile devices.

**FURTHER READING**

Smart edge devices that support efficient neural network (NN) processing have recently gained public attention. With algorithm development, previous work has proposed small-footprint NNs achieving high performance in various medium complexity tasks, e.g. speech keyword spotting (KWS), human activity recognition (HAR), etc. Among them, convolutional NNs (CNNs) perform well, which gives rise to the deployment of CNNs on edge devices. A hardware platform for edge devices should be (1) flexible to support various NN structures optimized for different applications; (2) energy efficient to operate within the power budget; (3) achieving high accuracy to minimize spurious triggering of power-hungry downstream processing, since it is often part of a large system.

This work proposes a weight tuning algorithm to improve the energy efficiency by lowering the switching activity of weight-related components, e.g. weight buses and multipliers. To achieve that, the algorithm reduces the Hamming distance between successive weights as shown in Figure 1. A flexible and runtime-reconfigurable CNN accelerator is co-designed with the algorithm. The system is fully self-contained for small CNNs. Speech keyword spotting is shown as an example with an integrated feature extraction frontend. As shown in Figure 2, a fully integrated custom ASIC is fabricated for this system. Based on post place-and-route simulation of the ASIC, the weight tuning algorithm reduces the energy consumption of weight delivery and computation by 1.70x and 1.20x respectively with little loss in accuracy.

FURTHER READING

Physical neural networks made of analog resistive switching processors are promising platforms for analog computing and for emulating biological synapses. State-of-the-art resistive switches rely on either conductive filament formation or phase change, processes that suffer from poor reproducibility or high energy consumption, respectively. To avoid such shortcomings, we establish an alternative synapse design (Figure 1a) that relies on a deterministic charge-controlled mechanism, modulated electrochemically in solid state, that consists of shuffling the smallest cation, the proton.

This proof-of-concept, protonic solid-state electrochemical synapse is a three-terminal configuration and has a channel of active material (A), here taken as WO₃. By protonation/deprotonation, we modulate the electronic conductivity of the channel over seven orders of magnitude, obtaining a continuum of resistance states (Figure 1b). A solid proton reservoir layer (R), PdHₓ, serves as the gate terminal. A proton conducting solid electrolyte (E), Nafion, separates the channel and the reservoir. By probing the atomic, electronic, and crystal structures (Figure 1c-d) involved during proton intercalating, we reveal an increase in the electronic conductivity of WO₃ resulting from the increase of both the carrier density and the mobility. This switching mechanism has several key advantages over other switching mechanisms, including low energy dissipation and good reversibility and symmetry in programming.

We are also working to improve device properties and integrability of this protonic synapse by exploring alternative materials for both the active channel and the solid-state electrolyte. On one hand, promising host materials for the intercalation of protons and multivalent ions, such as vanadium pentaoxide, graphene oxide, and tantalum pentaoxide, are being investigated as potential active materials. On the other hand, nanocrystalline yttrium-doped barium zirconate and gadolinium-doped cerium oxide are being studied as possible room-temperature fast proton conductor ceramics.

**FURTHER READING**

MEMS, Field-Emitter, Thermal, and Fluidic Devices

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X-rays are used for non-destructive imaging in virtually every industry today. They enable doctors to make diagnostic decisions to quality assurance for electronics and industrial components. The machines that do these tasks are large, bulky, and occasionally slow due to the design of the X-ray system. Every X-ray imaging system is generally limited to up to 2 X-ray sources due to the cost but primarily the size. The majority of commercial X-ray sources are based upon thermionic emission or a heated filament similar to that of an incandescent light bulb. Because of the high temperature of the thermionic source, it is difficult to shrink the size of the X-ray tube. Field emission is a solution that has been touted for decades, but it has always had reliability problems. We resolve these problems by demonstrating that a high-performance and potentially compact flash X-ray source can be realized. The current X-ray setup, completed in collaboration with Massachusetts General Hospital (MGH) and shown in Figure 1, has been shown to be reliable enough to take hundreds of images for computed tomography to reconstruct a 3D image. These X-rays were taken in pulsed mode, where short bursts of a few hundred nanoseconds are used to turn the field emitter on, the first demonstration of its kind.
Magnetrons are a highly efficient (>90%), high-power vacuum-based microwave source. In a magnetron, free electrons in vacuum are subject to a magnetic field while moving past open metal cavities, resulting in the emission of resonant microwave radiation. Current state-of-the-art magnetrons use a heated metal filament to thermionically emit electrons into vacuum continuously and are not addressable. This work seeks to replace the heated metal filament as a source of electrons with Si field emitter arrays to improve efficiency and increase power, especially when several sources are combined. Si field emitter arrays, schematically shown in Figure 1, are devices that are normally off and are capable of high current densities plus spatial and temporal addressing. These arrays consist of many sharp Si tips sitting on long Si nanowires that limit the current of the electron emission. Electrons from the Si tips tunnel into a vacuum as a result of the high electric field of the applied bias on the polysilicon gate. Pulsing the electric field applied on the gate can turn the arrays on and off. The proposed use of Si field emitter arrays in a magnetron will allow injection locking and hence phase control of magnetrons. Phase-controlled magnetrons have multiple applications in areas where high-power microwave sources are desired. Currently, Si field emitter arrays have been designed for the magnetron; our collaborators at Boise State University are testing them.

![Figure 1: (Left) 3-D rendering of Si device structure. For clarity, layers have been omitted in different regions of the rendering to show detail. In the front, the bare Si nanowires [200-nm diameter & 10-μm height] with sharp tips. (Right) Top view of a fabricated device with 350-nm gate aperture and 1-μm tip-to-tip spacing.](image-url)

**FURTHER READING**

Acoustically-active Surface for Automobile Interiors Based on Piezoelectric Dome Arrays

J. Han, J. Lang, V. Bulović
Sponsorship: Ford Motor Inc.

The surfaces of automobile interiors can be rendered acoustically active by mounting on them thin, wide-area membranes with arrays of small acoustic transducers. Each small, individually addressable transducer functions as a speaker or a microphone, and an entire pixelated acoustic membrane enables directional sound generation and sensing. The frequency response of the wide-area acoustically-active surface is determined by those of the small isolated acoustic transducers, which thereby yields better tunability of the bandwidth through designing pixel dimensions. As a result, the acoustically-active surface can work either in the audio frequency range for noise cancellation, personal entertainment, and communication with the vehicle, or - in the ultrasonic frequency range - for gesture detection, alertness monitoring, etc., which collectively improve the comfort and safety of the automobiles.

This project seeks to develop and demonstrate a thin, wide-area acoustic “wallpaper” based on an array of dome-shaped piezoelectric transducers, which exhibits outstanding performance and is deemed the most suitable option for miniaturization and scalable fabrication. Dependencies of device performance for both speaker and microphone applications on the material properties, dome dimensions, and back cavity structure have been studied through theoretical modeling and numerical simulation. For speaker applications, a 12-μm thick, 8-inch wafer-size acoustic wallpaper consisting of an array of PVDF domes that are sub-1-mm in diameter is capable of generating over 60 dBSPL a half meter away with a 1-kHz, 10-V driving voltage, which can be further enhanced by scaling up the area and reducing the thickness of the membrane. On the other hand, reducing the radius of PVDF domes will lead to an extended bandwidth into the ultrasound range at a small cost of sound pressure level in the audio frequency range. We have developed a scalable process to fabricate such acoustic wallpapers. A 1×1 cm² sample (Figure 1) has been fabricated for demonstration and will be scaled up to a 10×10 cm² wallpaper to explore prospective applications of acoustically active surfaces.

▲ Figure 1: A 1×1 cm² sample of the acoustic membrane with individually addressable acoustic transducers based on embossed PVDF domes. The inset shows a close-up scan of a single PVDF dome.
The Scanning Anode Field Emission Microscope: A Tool for Mapping Emission Characteristics of Field Emitter Array Devices and Structures

O. O. Ilori, A. I. Akinwande
Sponsorship: Air Force Office of Scientific Research

We developed a scanning anode field emission microscope (SAFEM) for characterizing field emission array (FEA) devices and structures (see Figure 1). The SAFEM is designed to accurately and precisely scan and position a probing anode tip over emitter tips of an FEA and acquire maps of emitter tip current $I_E(x,y)$ and anode-to-emitter voltage $V_{AE}(x,y)$ from which the map of spatial variation of the field factor $\beta(x,y)$ and the distribution $f(\beta)$ are extracted. The scanning and positioning movement is achieved by using two positioning stages. The first stage holds the device so a sample can move in the xyz direction with a travel range of 26 mm and resolution of 6 nm. The second stage holds the probing anode and can also move in the xyz direction with a travel range of 5 mm and a resolution of 0.03 nm. Its probing and imaging of emission currents from FEA devices and structures enable use of the SAFEM to observe the aging, i.e., temporal evolution of FEA devices in vacuum and gas ambient, and to measure accurately the turn-on and operating voltage of FEA devices. The SAFEM is operational and has been used to obtain current maps of various FEA devices, as in Figure 2. Images obtained by the SAFEM have been used to optimize the fabrication of FEAs for high-current and long-lifetime operations.

The resolution of the SAFEM is determined by scan step size, relative sizes of emitter tip radii ($r_E$), anode tip radius ($r_A$), and emitter array pitch ($T_P$): $r_E \ll r_A \ll T_P$. To obtain a well-resolved current map of FEA tips, the SAFEM is operated in the pulsed mode. The scanning motion, voltage (or current) sourcing, and current (or voltage) measuring functions of the SAFEM can be independently operated in either a pulsed or continuous mode. In the completely pulsed mode, the scanning anode moves a discrete scan step and enters a wait state long enough for the movement response to reach steady state. Once the steady state is reached, the source measure unit turns on the anode voltage and waits for the emission current response to also reach a steady value before the command to measure the current is issued. The duty cycles of the pulsing operation are critical to obtaining a well resolved current map. Operation in the pulsed mode significantly reduces the described noise current from the FEA substrate, nearby edges, nearby tips, and stage movements compared to other modes of operation.

![Figure 1: The completed SAFEM instrumentation.](image1)

![Figure 2: Test FEA device and corresponding current image.](image2)

FURTHER READING

Cold cathodes based on silicon field-emitter arrays (FEAs) have shown promise in a variety of applications requiring high-current-density electron sources. However, FEAs face a number of challenges that have prevented them from achieving widespread use in commercial and military applications. One problem limiting the reliability of FEAs is emitter tip burnout due to Joule heating. The current fabrication process for FEAs results in a non-uniform distribution of emitter tip radii. At a fixed voltage, emitters with a small radius emit a higher current while emitters with a large radius emit a lower current. Therefore, emitters with a small radius reach their thermal limit due to Joule heating at lower voltages and consequently burn out. Previous solutions to mitigating tip burnout have focused on limiting the emitter current with resistors, transistors, or nanowires in order to obtain a more uniform emission current.

In this project, we focused on increasing the uniformity of emitter tip radii as a means to reduce tip burnout. Figure 1 shows a typical distribution of emitter tip radii for FEAs. The non-uniform distribution of emitter tip radii first forms during the photolithography step that defines the array of "dots" that become the etching mask for the silicon tips. In our FEA fabrication process, we used a trilevel resist process that nearly eliminated the light wave reflected at the photoresist/silicon interface and hence improved the uniformity of the dot diameter. Furthermore, we integrated the emitter tips with silicon nanowires to improve their reliability. Figure 2 shows a diagram of the fabricated structure. Our fabrication process resulted in FEAs with a more uniform emission current and a potentially longer lifetime.

**FURTHER READING**

CMOS Opto-nanofluidics

J. Kim, H. S. Lee, R. J. Ram
Sponsorship: Kwanjeong Educational Foundation, Bose Foundation

CMOS (complementary metal-oxide-semiconductor) foundries offers designers access to nanometer scale patterns, a suite of readout and interface circuits, and, more importantly, the capability to mass-manufacture their designs. These features of microelectronic CMOS foundries have been extensively utilized for photonic applications. This abstract introduces their application to opto-nanofluidics.

In MicroTAS 2017, we first reported the process of fabricating nanofluidic channels inside CMOS chips by defining the channels using the polysilicon gate layer and releasing the channels by sacrificial etching. Since then, we developed a packaging approach to accommodate mm-sized dies, which are the norm in multi-project wafer runs. The CMOS opto-nanofluidic chip in Figure 1 was fabricated in a 65-nm SOI CMOS process (10LP+) with integrated photodetectors.

The packaging approach employs a low-cost epoxy material to extend the die area and a back-side machining step to planarize and thin the wafer down for subsequent lithography and etch steps. The I-V curves in Figure 2 indicate that the photodetectors are fully operational after the substrate extension and nanochannel release. Future chips will include an integrated amplifier with 0.6 μV/√Hz simulated input referred noise for improved sensitivity by lock-in detection. We plan to apply this CMOS opto-nanofluidic platform for single-molecule manipulation and sensing applications.

FURTHER READING

Increasing the Yield of Atmospheric Pressure Microsputtering for Fabrication of Agile Electronics

Y. Kornbluth, R. Matthews, L. Parameswaran, L. M. Racz, L. F. Velásquez-García
Sponsorship: U.S. Air Force

Additive manufacturing (AM) promises new, flexible production; however, while AM excels at creating structural parts, it cannot make functional objects well, e.g. multi-material structures such as electronic components and circuits. Sputtering, which removes material from a target atom-by-atom by using a plasma, is used in IC fabrication finely layered, multi-material fabrication. By miniaturizing the dimensions of the plasma reactor down to sub-millimeter scale, the sputterer can operate at atmospheric pressure, obviating the need for a vacuum. However, at atmospheric pressure, collisions with gas molecules scatter most of the sputtered material, preventing it from reaching the substrate.

We develop plasma microsputterer technology that allows for high-resolution, high-quality deposition of arbitrary patterns, without any templates, pre-, or post-processing; recent results with a gold target include creating imprints with electrical conductivity within an order of magnitude to that of bulk metal. We explore two methods to minimize sputtered material scattering and to increase the deposition rate (yield). The first method minimizes the gap between the sputtering target and the substrate (Fig. 1): the sputtering target is placed 150 µm above the substrate. Dielectric barriers confine the plasma, forcing the plasma to connect the target wire and anode without damaging the substrate. This approach yields 0.2 nm/s (40 pg/s)—twice previous results. However, significant substrate heating occurs, which is incompatible with temperature-sensitive substrates. The second method harnesses convection to drive the sputtered material towards the substrate (Fig. 2). We surround the microsputter target (100 µm diameter) with a strong jet of air (100 m/s, 0.5 mm thick coaxial flow) to force air molecules to transport the sputtered material. This method greatly increases the yield (1 nm/s, 20 ng/s)—30% of the sputtered material reaches the substrate. Current work focuses on further increasing the deposition rate by increasing the rate at which atoms are sputtered.

FURTHER READING

Rocket engines miniaturized and fabricated using MEMS or other techniques have been an active area of research for two decades. At these scales, miniaturized steam injectors like those used in Victorian-era steam locomotives are viable as a pumping mechanism and offer an alternative to pressure feed and high-speed turbo-pumps. Storing propellants at low pressure reduces tank mass, and this improves the vehicle empty-to-gross mass ratio; if one propellant is responsible for most of the propellant mass (e.g., oxidizer), injecting it while leaving the others solid or pressure-fed can still achieve much of the potential gain. Previously, the principal investigator and his group built and tested ultraminiature-machined micro jet injectors that pumped ethanol and also explored liquid and, more recently, hybrid engine designs. Recent work has focused on designing and implementing a whole-engine test article that simultaneously integrates a steam injector, boiler, decomposition chamber, fuel injector and thrust chamber, that is practical to build, and that is compatible with MEMS fabrication. An axisymmetric engineering mockup in brass was built to demonstrate the feasibility of the design concept (see Figure 1). Configurations that combine electrically-driven pumps with steam injectors by, for example, using electric pumps to pump fuel or coolant and a steam injector motivated by boiled coolant to pump oxidizer are also being explored. These would allow pressurized tanks to be avoided altogether while still being compatible with miniaturization via MEMS.

FURTHER READING

Neutron radiation is widely used in various applications, ranging from the analysis of the composition and structure of materials and cancer therapy to neutron imaging for security. However, most applications require a large neutron flux that is often achieved only in large infrastructures such as nuclear reactors and accelerators. Neutrons are generated by ionizing deuterium (D₂) to produce deuterium ions (D⁺) that can be accelerated towards a target loaded with either D or tritium (T). The reaction generates neutrons and isotopes of He, with the D-T reaction producing the higher neutron yield. Classic ion sources require extremely high positive electric fields, on the order of 10⁸ volts per centimeter (10 V/nm). Such a field is achievable only in the vicinity of sharp electrodes under a large bias; consequently, ion sources for neutron generation are bulky.

This work explores, as an alternative, highly scalable and compact Si field ionization arrays (FIAs) with a unique device architecture that uses self-aligned gates and a high-aspect-ratio (~40:1) silicon nanowire current limiter to regulate electron flow to each field emitter tip in the array (Figure 1). The tip radius has a log-normal distribution with a mean of 5 nm and a standard deviation of 1.5 nm, while the gate aperture is ~350 nm in diameter and is within 200 nm of the tip. Field factors, β > 1 × 10⁶ cm⁻¹ can be achieved with these Si FIAs, implying that gate-emitter voltages of 250–300 V (if not less) can produce D⁺ based on the tip field of 25–30 V/nm. In this work, our devices achieve an ionization current of up to 5 nA at ~140 V for D₂ at pressures of 10 mTorr. Gases such as He and Ar can also be ionized at voltages (<100 V) with these compact Si FIAs (Figure 2).

**FURTHER READING**

Silicon Field Emitter Arrays (FEAs) with Focusing Gate and Integrated Nanowire Current Limiter

G. Rughoobur, Lay Jain, A. I. Akinwande
Sponsorship: AFRL, IARPA

The advent of microfabrication has enabled scalable and high-density Si field emitter arrays (FEAs). These are advantageous due to compatibility with complementary metal-oxide semiconductor (CMOS) processes, the maturity of the technology, and the ease in fabricating sharp tips using oxidation. The use of a current limiter is necessary to avoid burn-out of the sharper tips. Active methods using integrated MOS field-effect transistors and passive methods using a nano-pillar (~200-nm wide, 8-µm tall) in conjunction with the tip have been demonstrated. Si FEAs with single gates reported in our previous works have current densities of >100 A/cm² and operate with lifetimes of over 100 hours.

The need for another gate (Figure 1) becomes essential to control the focal spot size of the electron beam as electrons leaving the tip have an emission angle of ~12.5°. The focus electrode provides a radial electric field that reduces the lateral velocity of stray electrons and narrows the cone angle of the beam reaching the anode. Varying the voltage on the focus gate reduces the focal spot size or achieves an electron beam modulator for radio frequency applications. In this work, we fabricate dense (1-µm pitch) double-gated Si with an integrated nanowire current limiter (Figure 2). The apertures are ~350 nm and ~550 nm for the extractor and focus gates, respectively, with a 350-nm-thick oxide insulator separating the two gates. Electrical characterization of the fabricated devices shows that the focus-to-gate ratio (VFE/VGE) can be used to control the anode current (Figure 2). When the focus voltage exceeds the gate voltage, the field superposition increases the extracted current, and vice versa. These devices can potentially find applications as high-current focused electron sources in flat panel displays, nano-focused X-ray generation, and microwave tubes.

![Figure 1: Si field emitter array with integrated current limiter, self-aligned extractor, and focus gates for nano-focused cold electron sources.](image1)

![Figure 2: Electrical characterization of 500 x 500 arrays with different focus/gate voltage ratios at 1000 V anode; inset shows the fabricated double-gated array.](image2)

**FURTHER READING**

Electron Transparent Anodes for Field Emission Cathodes in Poor Vacuum

G. Rughoobur, L. Jain, A. I. Akinwande
Sponsorship: AFOSR, Multidisciplinary University Research Initiatives

Nanoscale Vacuum Channel Transistors (NVCTs) using field emission sources could potentially have superior performance compared to solid state devices of similar channel length. This is due to ballistic transport of electrons, shorter transit time and higher breakdown voltage in vacuum. Furthermore, there is no opportunity for ionization or avalanche carrier multiplication imbuing NVCTs with very high Johnson figure of merit (~10^14 V/s). However, field emitters need ultra-high vacuum (UHV) for reliable operation as the field emission process is sensitive to barrier height variations induced by adsorption/desorption of gas molecules. Small changes in the barrier height cause exponential variations in current. Poor vacuum also leads to generation of energetic ions that bombard the emitters, altering the work function and degrading electrical performance.

To overcome the UHV requirement, graphene can be used to nano-encapsulate the field emitter in UHV or a gas (e.g. He) with high ionization energy. Separation of the electron tunneling region from the electron acceleration region enables emission of electrons in UHV and electron transport in poor vacuum, if not atmospheric conditions. For mechanical strength, a multi-layer graphene structure that is transparent to electrons while being impervious to gas molecules/ions is necessary. In this work experimentally characterize the electron transparency of graphene membranes using arrays of gated Si field emitters with 1 µm pitch (Figure 1) that exhibit transistor-like characteristics. Using an energized multi-layer graphene/grid structure (Figure 2) in combination with emitter arrays, we measured extremely high electron yield perhaps due to secondary emission from electrons impinging on the graphene layer. Adopting this architecture for NVCTs will allow the realization of empty state electronics capable of functioning at higher frequencies (THz regime) higher power and harsher conditions (high radiation and high temperature) compared to solid state electronics.

**FURTHER READING**

Field emitters (FE), or namely vacuum transistors, are promising for harsh-environments and high-frequency electronics thanks to their radiation hardness and scattering-free electron transport. However, the stability and operating voltage still need improvement to enable circuit applications. To overcome these issues, III-Nitrides are excellent candidates due to their strong bonding energies and tunable electron affinities. Though the material properties of III-Nitrides are promising, so far, there are few works demonstrating sub-100 V turn on as most III-N FEs are still two-terminal structures.

In this work, we demonstrate a novel GaN nanowire (NW) FEs based on self-aligned gates to reduce the gate-emitter turn-on voltage ($V_{GE, ON}$) below 30 V. The GaN on Si wafer was grown by Enkris Semiconductor, Inc. Thanks to a new GaN processing technology, we successfully fabricate GaN NWs with width of 60 nm and aspect-ratio of 5 (Figure 1 (a)). The gate stack is then conformally deposited. We then finish the device fabrication by dry etching to open FEs’ tips (Figure 1 (b)).

We measure the transfer characteristics with a suspended 0.5-mm-diameter tungsten ball biased at +500 V as an anode (Fig. 2(a)). Device turns on at 27 V. This device demonstrates the lowest turn-on voltage among GaN field emitters in literature, as well as excellent current density (Fig. 2 (b)) and shows great potential for integrated circuit applications.

**FURTHER READING**

Miniaturized pumps can be used to supply precise flow rates of liquid in compact systems. Numerous microfabricated positive displacement pumps for liquids with chamber volumes that are cycled using valves have been proposed. Pumps made via standard (i.e., cleanroom) micro-fabrication typically cannot deliver large flow rates without integrating hydraulic amplification or operating at high frequency due to their small pump chambers.

3D-Printing has recently been explored as a processing arena for microsystems; in particular, researchers have reported 3D printed pumps for liquids and gases with performance on par with or better than counterparts made with standard microfabrication.

Building on earlier work on printed magnetically actuated liquid pumps, we 3D-printed multi-material, magnetically driven, valve-less miniature liquid pumps. We used the fused filament fabrication (FFF) method: a thermoplastic filament is extruded from a hot nozzle to create, layer by layer, a solid object. The body of the pump is printed in Nylon 12, while the actuation magnet is printed in Nylon 12 containing NdFeB micro-particles. The devices are driven by a non-contact rotating magnet and employ valve-less diffusers to greatly simplify operation.

Our low-cost, leak-tight, miniature devices are microfabricated using 150- and 225-µm layers with a multi-step, multi-material printing process (Figure 1) that monolithically creates all key features with <13-µm in-plane misalignment. Each pump has a frame, a 225-µm-thick membrane connected to a piston with an embedded magnet, a chamber, two diffusers, and two fluidic connectors (Figure 2). Fabrication of the pump requires under 75 minutes and costs less than $3.89. Finite element analysis of the actuator predicts a maximum stress of 15.7 MPa @ 100 µm deflection, i.e., below the fatigue limit of Nylon 12 for infinite life (i.e., 19 MPa). Water flow rate up to 1.68 ml/min at an actuation frequency of 204 Hz was measured.

**Further Reading**
Measurement of the Condensation Coefficient of Water Using an Ultrathin, Nanoporous Membrane

Sponsorship: NSF

In applications ranging from electronics cooling and power generation cycles to distillation, liquid-vapor phase change phenomena play a critical role. At their fundamental (kinetic) limits, evaporation and condensation are dictated by the resistance to molecules crossing the liquid-vapor interface, which is quantified by the condensation coefficient. Despite its fundamental importance and widespread use in heat transfer models such as the Schrage equation, the condensation coefficient of water has been difficult to characterize, with experimental results and theoretical calculations spanning three orders of magnitude. Experimental measurement has been challenging because three conditions must be satisfied: sensitivity to the condensation coefficient is high, temperature of the liquid-vapor interface is precisely yet noninvasively measured, and the concentration of contaminants at the liquid-vapor interface is low. To achieve a precise measurement of the condensation coefficient of water, we have fabricated an ultrathin (~200 nm), nanoporous (~150 nm diameter), hydrophobic membrane for forward-osmosis (FO) driven transport (Figure 1). Due to the ultrathin, low-aspect ratio dimensions of the membrane, we achieve high sensitivity to the condensation coefficient and avoid undesired contaminant buildup at the interface because the membrane is freestanding. Since transport is driven by osmotic pressure, the system can be maintained at isothermal conditions such that the temperature can be precisely measured in the bulk water without interfering with the liquid-vapor interface. These experimental measurements of the condensation coefficient of water are crucial for modeling liquid-vapor phase change in nanoscale systems and advanced thermal management devices.

FURTHER READING


▲ Figure 1: (a) Schematic of the FO experiment. The blue arrow indicates the flux of water vapor across the hydrophobic membrane, which is measured by the volume change $V(t)$ of liquid in the precision syringe. (b) SEM image of the nanoporous membrane, the scale bar is 200 nm.
Field emission is the quantum tunneling of electrons to vacuum due to local high electrostatic fields; such high fields can be generated at a moderate voltage using nanosharp, high-aspect-ratio tips. Compared to thermionic counterparts, field emission cathodes consume less energy, respond faster, and can operate in poorer vacuum, making them attractive in compact applications such as nanosatellite electric propulsion, portable mass spectrometry, and handheld X-ray generation. A wide variety of materials has been explored as field emitters; the research in field emission electron sources has focused on carbon nanotubes (CNTs) due to their nanosized tip diameter, high aspect-ratio, high electrical conductivity, and excellent chemical stability. However, most manufacturing methods for CNT field emission electron sources have associated large cost, long processing time, need of static masks for defining in specific locations the nanostructured emitting material and/or the electrode(s), and large gate interception (or the need for advanced assembly methods to attain high transmission).

In this project, we are developing low-cost field emission cathodes via multi-material extrusion. The devices are flat plates with two concentric imprints (Figure 1): an imprint made of CNTs (emitting electrode), symmetrically surrounded on both sides by an imprint made of Ag microparticles (extractor gate). Unlike the great majority of field emission cathodes reported that have an out-of-plane gate electrode, our devices have an in-plane gate that significantly reduces the cost and manufacturing complexity of the device and also facilitates high gate transmission. Our devices can emit electrons in vacuum with as little as 62 V applied between the CNT imprint and the Ag imprint and achieve over 97% gate transmission (Fig. 2). Current work focuses on increasing the imprint density to attain larger current density emission and on developing ballasting structures for attaining large and uniform array emission.

FURTHER READING


▲ Figure 1: Optical top view of a square-loop field emission source with 700-µm pitch between adjacent traces

▲ Figure 2: Emitted, gate, and collected currents vs. bias voltage for the device shown in Figure 1.
A corona discharge is a self-sustained physical phenomenon induced around the sharper electrode of a diode due to sharply nonuniform electric fields within the interelectrode space. Ion propagation across such a space is accompanied by collisions with neutral particles, resulting in bulk fluid movement known as ionic wind. In contrast to traditional counterparts, ionic wind pumps have no moving parts, respond faster, and produce significantly less noise, drawing great interest in applications such as air propulsion and electronics cooling. Currently, ionic wind pump technology is far from practical in applications that require large flow velocity, flow rate, and power efficiency; another concern is the stability of the pump, given that ion accumulation in the interelectrode space can cause an electric short during sustained operation. Researchers have proposed using active electrodes with a plurality of field enhancers arranged in parallel (multiplexing) to maximize throughput; however, the reported multi-needle devices are serially assembled, and their performance is inferior to that of single-needle counterparts.

This project uses metal additive manufacturing and electropolishing to create miniature, multi-needle ionic wind pumps. Our devices are needle-ring corona diodes composed of a monolithic inkjet binder-printed active electrode (Figure 1), made in stainless steel 316L, with a plurality of sharp, conical needles and a thin plate copper counter-electrode, with electro-chemically etched apertures aligned to the needle array. Five-needle ionic wind pumps eject air at 2.9 m/s and at a volumetric flow rate of 343 cm$^3$/s, three times larger than the flow rate of a single-tip device with comparable efficiency (Figure 2). Current work systematically studies the relevant parameters to optimize the design of the electrohydrodynamic pump.
3D-Printed Silver Catalytic Microreactors for Efficient Decomposition of Hydrogen Peroxide

E. Segura-Cardenas, L. F. Velásquez-García
Sponsorship: MIT-Tecnologico de Monterrey Nanotechnology Program

Microreactors increase the surface-to-volume ratio of their reactants and by-products, resulting in faster, more efficient reactions and better heat transfer than in their non-miniaturized counterparts, leading to higher throughput per unit of reactor active volume and to better selectivity in the species produced by the reactor. The great majority of microreactors are made of polydimethylsiloxane (PDMS)—a material that cannot operate at elevated pressures or temperatures. Other reported microreactors are made in silicon, ceramics, or metals; although these materials are compatible with high-pressure and high-temperature operation, they have associated a very high production cost because they are made in a semiconductor cleanroom or with specialized, low-throughput tooling, e.g., electro discharge machining.

Hydrogen peroxide (H$_2$O$_2$), a water-soluble oxidant, spontaneously decomposes in the presence of heat or a catalyst. Applications of a H$_2$O$_2$ catalytic reactor include monopropellant rocket propulsion, steam generators, and pumping; miniaturized versions of such catalytic reactors are of great interest to PowerMEMS. Here, we developed a novel additive manufacturing technique based on silver clay extrusion to create high-pressure compatible and high-temperature compatible, monolithic microfluidics; silver is also a very efficient and effective catalyst for the decomposition of H$_2$O$_2$. Our microreactors are composed of a water-tight microchannel connected to the exterior via two fluidic ports (Figure 1). The experimental performance of the microreactor as a catalytic decomposer of H$_2$O$_2$ matches well our reduced-order modeling estimates (Figure 2), attaining a decomposition efficiency of 87% for a flow rate of 5 μL/min of H$_2$O$_2$ with an initial concentration of 30% w/w. Current research focuses on exploring other applications, e.g., heat exchangers.

FURTHER READING

Management of Brine Effluent from the Desalination Plant

J. Yoon, I. Shrivastava, J. Han
Sponsorship: Kuwait Foundation for the Advancement of Sciences

While large-scale desalination has been a mainstay in a country with a severe water shortage for many decades, management of high concentration brine effluent (> 50,000 TDS) has posed technological, economic, and environmental challenges. There are two research directions to treat the brine effluent effectively: (1) reduce the total volume of effluent onshore and (2) discharge the effluent offshore to minimize environmental impact. Interestingly, the production of effluent is tons of liters, but both studies implement a diffusion process of molecule in the effluent, which appears on a microscopic scale. Here, two technologies are briefly introduced: ion concentration polarization (ICP) to reduce effluent volume and offshore discharge of effluent using plunging liquid jets to minimize environmental impact.

ICP process is a novel electrochemical desalination technology, which emerged within the last decade as a viable option for effluent treatment (Figure 1). ICP employs only a cation exchange membrane (CEM) to utilize a higher diffusivity of chloride ($t^{(\beta)}$), which is the majority ion in the effluent. Compared with conventional electrochemical desalination such as ED (electrodialysis), it is more energy-efficient, less susceptible to various fouling, and can be implemented with a much smaller footprint. Our group has developed and matured the technology over the years to realize the first-ever lab-scale ICP desalination prototype (~0.1L/min), demonstrating its technical and economic feasibility, and secured several key intellectual properties on this technology.

For the offshore discharge of brine, we are investigating the use of plunging liquid jets (Figure 2) through laboratory experiments. Similar to the widely used offshore discharge outfalls such as submerged or surface jets, plunging jets also utilize the high momentum and negative buoyancy of brine to induce mixing with the surrounding ocean water and reduce the concentration of contaminants such as salt, anti-fouling agents, and anti-scalants that, in turn, reduce the environmental impact. However, unlike these outfalls, plunging jets also introduce air into the water column which, when dissolved, can reduce the environmental impact associated with the creation of hypoxic (low dissolved oxygen) zones.

FURTHER READING

Reducing emissions of internal combustion engines is the major focus in the modern automotive industry. Lubrication oil leakage from the piston ring pack is critical to oil consumption and emission. The oil transport mechanism is not well understood due to the computational complexity of the oil motion and ring pack dynamics and experimental difficulty. This raises our interest to build a reduced-order model predicting the oil movement inside the ring pack with acceptable accuracy and efficiency.

In this work, we proposed a neural-network-based method to perform model order-reduction (MOR) on the computational fluid dynamics (CFD). First, we use a variational autoencoder (VAE) to address the reduce basis of the fluid field and encode the original space into the reduced space. Second, we apply a recurrent neural network (RNN) to learn the dynamics of the reduced space. To guarantee the stability of system dynamics, certain physics-based conservation law and stability regularization are included in the loss function. This method can reduce the fluid dynamics model calculation time by orders of magnitude with acceptable accuracy for analysis. With the reduced-order oil transport model coupled with the piston ring dynamics model, we can quantitatively analyze the mechanisms for oil leakage and inspire design optimization in automotive industry.

The methodology developed in the work is not limited to fluids. The same procedures are applicable to other physical system modeling. Further, the methodology can interpret the neural network behavior from the perspective of model order-reduction.

▲ Figure 1: Snapshots of oil dropping inside piston groove (upper row: CFD results, lower row: MOR results with 4 reduced orders.)
▲ Figure 2: Schematic of neural-network-based MOR.
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Epitaxy laid a foundation for conventional electronic systems as it produces high-quality single crystalline materials. To grow various materials through epitaxy, heteroepitaxy is required as a limited set of available substrates exists. However, a lattice-mismatched issue in heteroepitaxy leads to degradation in the materials’ quality by introducing dislocations to release accumulated strain energy due to the lattice-mismatch. Here, we report a unique approach to release the accumulated strain energy in heteroepitaxy by coating graphene on substrates. As graphene provides a slippery nature on substrates, deposited particles are easily moved around to have energetically favorable atomic lattice. Thus, inserted graphene allows us to grow strain-free single-crystalline materials, a process named spontaneous relaxation. We expect this spontaneous relaxation will be useful to realize the monolithic integration of various lattice-mismatched systems.

Figure 1 shows a mechanism of strain relaxation in conventional epitaxy. GaP was grown on GaAs substrate that has 3.7% misfit strain. Because of the lattice-mismatch, a substantial number of dislocations was introduced to release the accumulated strain energy above a critical strain level. This energy is known as a source to degrade the material’s properties. On the other hand, Figure 2 shows a scenario of strain relaxation through spontaneous relaxation. GaP was grown on a graphene-coated GaAs substrate. As graphene has lattice transparency and provides a slippery surface on top of the substrates, strain-released GaP was obtained. These results demonstrate the feasibility of another strain relaxation pathway on graphene-coated substrates, which will broaden the materials set available for heteroepitaxy.

**FURTHER READING**

Graphene-based Tunneling Nanoelectromechanical Switch

M. Gao, F. Niroui, V. Bulovic, J. H. Lang
Sponsorship: NSF Center for Energy Efficient Electronics Sciences (E3S)

Nanoelectromechanical (NEM) switches are considered to be a promising complementary technology for conventional logic switches because of their zero static power consumption and potential for low-voltage operation. However, they can suffer from stiction caused by significant van der Waals forces acting on their nanoscale structures. Such stiction can easily lead to the permanent failure of a conventional NEM switch and generally prevents miniaturization, leading to a high actuation voltage. Therefore, for NEM switches to be competitive, it is necessary to develop a NEM switch with high switching reliability, low-voltage operation, and ultra-low power consumption. The fabrication of such a switch should also be scalable to enable its popularization within the digital integrated-circuit industry.

This work advances the development of a novel squeezable NEM switch, called a squitch. To fabricate the squitch as shown in Figure 1, a pair of nanometer-smooth gold electrodes are fabricated via electron beam lithography and transferred to a glass substrate. A monolayer of polyethylene glycol (PEG)-thiol is then deposited on electrodes via a self-assembly process. Finally, a single layer of graphene is patterned and transferred onto the bottom part of the squitch. Varying the voltage applied between the gold electrodes can electrostatically modulate the thickness of the compressible PEG-thiol monolayer, enabling an exponential change of the current tunneling through it.

At this point, as shown in Figure 2, an on/off current ratio of 100:1 with sub-1 V actuation has been achieved. The devices can also survive 10 to 100 cycles of operations, showing observable durability. The fabrication yield is up to ~40% and can be further improved by modifying the methods of transferring graphene and exploring new molecules with the appropriate mechanical properties. In the future, we plan to design a squitch based completely on graphene while keeping the current structure to avoid the potential effect of electromigration.

FURTHER READING

Low-temperature Ferroelectric Hf$_{0.5}$Zr$_{0.5}$O$_2$ for InGaAs-channel Negative Capacitance Field-effect-transistors

T. Kim, D. A. Antoniadis, J. A. del Alamo
Sponsorship: Semiconductor Research Corporation, Samsung Electronics

Negative capacitance (NC) MOSFETs by integrating ferroelectric (FE) hafnium zirconium oxide (HZO) film in the MOS gate stack have generated enormous interest due to its performance-boosting and CMOS process compatibility. Stable ferroelectricity in the HZO film is usually obtained after a rapid thermal annealing (RTA) step at 500°C. This is because film crystallization under the right conditions is crucial for the formation of the FE orthorhombic phase. However, in order to achieve NC InGaAs-channel MOSFETs, as is our goal, a low-temperature process is essential to preserve the integrity of the gate oxide/InGaAs channel interface. This is also needed for precise capacitance matching. In our work, we have focused our attention towards enabling a low thermal budget process for FE formation of HZO film.

After optimization of the HZO atomic layer deposition (ALD) process, Metal – FE – Metal (MFM) capacitors were fabricated to characterize the FE properties, as shown in Figure 1. To provide higher tensile stress and promote the formation of the orthorhombic phase in the HZO film during RTA, 100 nm-thick TiN as electrode was introduced. Figure 2 shows the polarization – voltage characteristics of MFM capacitors annealed at 500°C and 400°C. The result demonstrates that the HZO film attains FE properties with a 400°C thermal process. This is also confirmed by the strong FE switching current peaks observed in Figure 3.

We are in addition exploring the further decrease of process temperature of HZO crystallization through the introduction of a ZrO$_2$ seed layer under the HZO film (Figures 2 and 3). This has been shown to boost orthorhombic phase formation. Going beyond, we have observed that HZO film deposited by plasma-enhanced ALD (PE-ALD) yields ferroelectric behavior with a 350°C thermal process. Our research will continue by integrating the optimized gate stack with our established InGaAs MOSFET platform for developing InGaAs NCFETs.

FURTHER READING

Artificial Heterostructuring of Single-crystalline Complex-oxide Membranes
H. S. Kum, W. Kong, K. Qiao, S.-H. Bae, J. Kim
Sponsorship: DARPA

Epitaxial heterostructures are the backbone of many important electrical and photonic devices used today. Although many dissimilar crystals can be utilized, epitaxy is limited by the choice of substrates. In other words, the epitaxial film must be similar to the crystal structure of the host wafer. Such limitations impede the advancement of heterostructure engineering and prevent many novel physical phenomena from being discovered because they prevent epitaxial growth of dissimilar materials on a single substrate.

To overcome this limitation, we have developed a method to easily remove the epitaxial layer and transfer it onto any arbitrary substrate by using graphene as a release platform in a method called remote epitaxy. By extending this method to complex-oxide material systems, we have, for the first time, artificially created a complex-oxide membrane heterostructure by stacking piezoelectric PMN-PT and magnetostrictive CoFe₂O₄ (CFO) and hybridizing their properties. Both membranes were released from the substrates and were manually stacked by hand, with the PMN-PT membrane having a thickness of 500 nm and CFO having a thickness of 300 nm. The multiferroic heterostructure was fabricated into a device that allowed measurement of the voltage generated across the PMN-PT membrane (Figure 1).

The device was measured by applying a magnetic field across the entire heterostructure and measuring the resulting voltage generation across the PMN-PT membrane. In this device, the magnetic field strains the CFO membrane, and that strain is transferred to the PMN-PT, generating voltage (i.e., magnetoelectric coupling). We noticed that completely freestanding devices generated higher voltages by several factors than devices still clamped to the substrate (Figure 2). These results demonstrate the feasibility of creating novel heterostructures that have never been possible before using remote epitaxy and show the advantages of utilizing freestanding membranes as opposed to those still stuck on their substrates.

FURTHER READING

Continued IC scaling requires interconnects with cross-sectional dimensions in the <10nm range. At these dimensions the resistance of interconnects increases dramatically due to surface and grain boundary electron scattering. The reliability of interconnects with nanoscale dimensions is also expected to be compromised by reduced morphological stability. As a part of a collaborative program focused on ballistic conduction and morphological stability of single-crystal nanometer-scale interconnects, we are investigating the crystallographic dependence of the morphological stability of Ru wires.

Thin single-crystal films agglomerate into small particles via capillary driven surface diffusion in a process known as solid-state “dewetting.” With decreasing film thickness, the temperature at which dewetting occurs is well below the constituent materials melting temperature. However, previous work on single-crystal (FCC) Ni films has demonstrated that crystalline anisotropy gives rise to special crystallographic orientations along which single-crystal wires are kinetically stable (Figure 1). Interconnects composed of such wires should have decreased vulnerability to morphological instabilities during processing and circuit operation. These wires will have strongly faceted surfaces which are predicted to reduce electron scattering and decrease interconnect resistance. Ru is a candidate material for future interconnects, and exploratory work with single-crystal (0001) films suggests that wires oriented along directions will be particularly stable (Figure 2). Work on patterning and testing of such wires is currently underway. In addition to this experimental work, we are working toward accurate simulations of anisotropic solid-state dewetting. These simulations reproduce the dramatic effect that stable surfaces can have on wire stability and provide an opportunity to systematically probe the effects of individual material properties. Combining the results of these experiments and simulations with those of past work on Ni will provide insights that will enable optimization of interconnect structural and crystallographic factors for design of morphologically stable nanowires with cross-sectional dimensions significantly below 10nm.

**FURTHER READING**

Electronics is approaching a major paradigm shift because silicon transistor scaling no longer yields historical energy-efficiency benefits, spurring research towards beyond-silicon nano-technologies. In particular, carbon nanotube field-effect transistor (CNFET)-based digital circuits promise substantial energy-efficiency benefits, but the inability to perfectly control intrinsic nanoscale defects and variability in carbon nanotubes has precluded the realization of very-large-scale integrated systems. Here we overcome these challenges to demonstrate a beyond-silicon microprocessor built entirely from CNFETs: RV16X-NANO. This 16-bit micro-processor is based on the RISC-V instruction set, runs standard 32-bit instructions on 16-bit data and addresses, comprises more than 14,000 complementary metal–oxide–semiconductor CNFETs and is designed and fabricated using industry-standard design flows and processes. We propose a manufacturing methodology (MMC) for carbon nanotubes, a set of combined processing and design techniques for overcoming nanoscale imperfections at macroscopic scales across full wafer substrates. The key elements of MMC are:

1. **RINSE** (removal of incubated nanotubes through selective exfoliation). We propose a method of removing CNT aggregate defects through a selective mechanical exfoliation process. RINSE reduces CNT aggregate defect density by >250× without affecting non-aggregated CNTs or degrading CNFET performance.

2. **MIXED** (metal interface engineering crossed with electrostatic doping). Our combined CNT doping process leverages both metal contact work function engineering as well as electrostatic doping to realize a robust wafer-scale CNFET CMOS process. We experimentally yield entire dies with >10,000 CNFET CMOS digital logic gates (2-input ‘not-or’ gates with functional yield 14,400/14,400, comprising 57,600 total CNFETs), and present a wafer-scale CNFET CMOS uniformity characterization across 150-mm wafers.

3. **DREAM** (designing resiliency against metallic CNTs). This technique overcomes the presence of metallic CNTs entirely through circuit design. DREAM relaxes the requirement on metallic CNT purity by about 10,000× (relaxed from a semiconducting CNT purity requirement of 99.999999% to 99.99%).

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**FURTHER READING**

Electrospraying is a high-electric field physical phenomenon that transforms electrically conductive liquids into fine, uniform streams of micro/nanoparticles; the applications of electrospraying include mass spectrometry, nanosatellite propulsion, combustors, and agile manufacturing. Unfortunately, electrospray emitters have very low throughput; consequently, several research groups have investigated, for about two decades, greatly increasing the electrospray source’s throughput via emitter multiplexing, using micro- and nanotechnology to attain lower startup voltage and denser emitter arrays. Although successful, the reported implementations harness cleanroom microfabrication, which has an associated high cost that is incompatible with many applications of electrospraying. In this project, we explore the use of additive manufacturing to create, at a very low cost, monolithic arrays of electrospray emitters capable of ion emission.

We have succeeded at demonstrating the first additively manufactured ionic liquid electrospray sources in the literature; our devices produce per-emitter current comparable to that produced by silicon microfabricated counterparts, at a small fraction of their fabrication cost. The devices are diodes composed of an emitting electrode and an extractor electrode: the emitting electrode is a monolithic array of digital light projection (DLP)-printed solid, conical, polymeric needles covered by a conformal layer of hydrothermally grown zinc oxide (ZnO) nanowires as a wicking material (Figure 1), while the extractor electrode is a laser-cut SS 316L plate with an array of apertures that matches the pattern of the array of needles. Characterization of the devices in vacuum using the ionic liquid EMI-BF₄ demonstrates bipolar, uniform array emission of solvated ions—in agreement with the literature on ionic liquid ion sources. Current research efforts focus on increasing the number of emitters per unit of area and on exploring other materials and designs for implementing the devices.

FURTHER READING

Soldiers’ Hearing Health Protection and Auditory Augmentation Using Electrostatic NEMS

A. Murarka, J. H. Lang, V. Bulović
Sponsorship: ISN

Our work on acoustic nanomembrane electromechanical transducers (NEMS) that can safely fit and operate inside an ear is motivated by the desire to improve U.S. soldiers’ auditory health. From the time soldiers set foot on training grounds to their deployment in war zones, they are consistently exposed to deleterious noise from rapid gunshots, friendly fire, explosions, jet engines, and armored personnel carriers. Noise levels from these sources often exceed safe hearing thresholds and can inflict irreversible ear trauma and hearing loss. Existing hearing protection solutions that attempt to mitigate tactical noise are often insufficient and compromise communication, combatant response time, and response accuracy. Indeed, it is recognized that hearing loss resulting from military service is a massive financial and clinical burden, which needs a technical solution that can protect soldiers and assist veteran civilians.

To simultaneously provide hearing protection, effective tactical communication, and situational awareness, an in-the-ear acoustic system is needed, one that can operate at low power with distortion-free acoustic output over the entire human auditory range. Scalable versions of such systems do not yet exist, which motivates us to suggest that the design of our electrostatic NEMS enables them to operate as ultra-low-power microspeakers. The low weight, the material composition, and the geometry of our NEMS membranes ensure linear and near-uniform acoustic output in the human auditory range. Hence, if integrated with earmolds, our NEMS could be used as high-fidelity microspeakers for speech enhancement in communication and noise attenuation. The same transducers can also act as acoustic dosimeters and as ambient-facing microphones for sensing acoustic signals. This composite reversible device is designed to attenuate harmful sounds while enhancing verbal communication and maintaining acoustic transparency with the surroundings. Leveraging our nanomembrane transducer technology, we aim to reach superior size, weight, and power consumption specifications, with no compromise in performance.

FURTHER READING

The size of state-of-the-art deep neural networks (DNNs) and consequent computation load have been increasing ever since the beginning of their outbreak. Since bigger and deeper neural networks trained with larger data sets generally provide better performance, this trend is expected to accelerate in the future. However, this poses as a significant problem for conventional digital architectures as the energy and time consumption for training DNNs have become unmanageable.

The idea of using analog resistive crossbars to do parallel vector-matrix multiplications based on Ohm’s and Kirchhoff’s Laws have been known since 1960s. It was recently discovered that rank-one outer product-based updates can also be performed in parallel using pulse-coincidence for multiplication and incremental conductance change of devices for accumulation. These advancements have fueled the investigation of various non-volatile analog resistive memory technologies to realize fast, energy-efficient and versatile platforms for deep learning.

In this work we implement a three-terminal electrochemical (i.e. battery-like) resistive memory device, employing the smallest ion, the proton. The conductance of the device is determined by the proton concentration intercalated inside the channel material. Electrical pulses applied to the gate enable protons to drift between the reservoir and the channel through the solid electrolyte as electrons move through the external circuit in the same direction (Fig. 1). When the gate is electrically open, proton movement through the electrolyte is forbidden since electrons cannot flow through the outside circuit, enabling non-volatile memory. We have demonstrated this concept on devices composed of a WO$_3$ channel, Nafion electrolyte and Pd as hydrogen reservoir (Fig. 2) Devices have very low energy consumption (18 aJ/(μm$^2 \times$ nS), nearly symmetric modulation characteristics and long cycling lifetime. Future work will involve optimizing the material stack, scaling and integration of these devices ultimately realizing a full-scale DNN training accelerator.

![Figure 1: Working principle of the designed electrochemical device, with proton as the intercalation cation to tune the conductivity of the channel material.](image1)

![Figure 2: Demonstration of reversible, multi-state conductance modulation by protonating/deprotonating a metal-oxide channel using identical current pulses.](image2)

**FURTHER READING**

High-throughput Vapor Transport Deposition of Organic-inorganic Perovskite Films

A. Panda,* E. Wassweiler,* Vladimir Bulović
(*Equal Contributors)
Sponsorship: Tata Trusts

Vapor transport deposition (VTD) is a promising technique for enabling high-throughput large-area deposition of next-generation perovskite solar cells. VTD uses a carrier gas to transfer sublimed salts from source to substrate, where they react to form perovskite films. Unlike vapor thermal evaporation, VTD decouples the material deposition rate from material temperature, allowing for high-throughput deposition. VTD allows independent control of chamber pressure and deposition rate, parameters which can be tuned to change the film crystallization kinetics. Like thermal evaporation, VTD permits precise control of thickness and eliminates hazardous solvents from device fabrication, allowing facile growth of complex multi-layer device structures such as tandem solar cells. The high throughput deposition coupled with low vacuum operation reduces the capex requirement for VTD deposition tools and has led to commercialization of the technique for CdTe and organic semiconductor materials manufacturing.

Through the use of a custom home-built VTD setup, we study perovskite solar cell active-layer film formation via co-evaporation of lead iodide and methylammonium iodide (MAI). We determined parameters and deposition conditions necessary to form high-quality methylammonium lead iodide films. We found that control of MAI degradation and its deposition rate during VTD is a critical challenge that must be overcome. Last, we developed numerical simulations of material diffusion and gas flow necessary to narrow the VTD design parameter space. We are assembling the next-generation VTD reactor to study the impact of critical parameters such as substrate temperature, carrier gas flow rate, chamber pressure, and deposition rate on film formation kinetics by examining metrics such as photoluminescence, x-ray diffraction, morphology, and device efficiency. We aim to demonstrate VTD to be a viable new deposition method for large-area high-throughput manufacturing of perovskite solar cells.
Imaging Moiré Periodicities at the 2D/3D Interface Using 4D STEM

K. Reidy, G. Varnavides, J. D. Thomsen, A. Blackburn, J. M. LeBeau, F. M. Ross
Sponsorship: Thomas Lord Foundation

Structure and defects at the interface between 2D materials and their 3D bulk adjuncts greatly influence nanoscale device properties, such as contact resistance, photo-response, and high-frequency performance. Knowledge of fundamental charge transfer at this interface is critical for the continued and rapid development of devices that utilize 2D materials. Recent advances in scanning transmission electron microscopy (STEM), such as aberration correction and 4D STEM, allow analysis of interface growth, structure, and ordering. In this work, we use 4D STEM to directly image hidden moiré periodicities arising from epitaxial growth of nanoislands on 2D materials in ultra-high vacuum.

Epitaxial growth creates moiré patterns arising from rotation and lattice mismatch between the nanoisland and underlying 2D material substrate. We use 4D STEM to directly image these periodic superlattices, which are not visible in conventional TEM or STEM and often can result in strong electron correlations. DFT calculations show that this moiré is directly responsible for a periodic modulation of electronic structure in the 2D material. Our work illustrates the essential role of emerging microscopy techniques to unveil the mechanisms of moiré superlattices, and we explore the implications of these on physical properties at the 2D/3D interface, such as enhanced charge transfer and moiré-modulated local interactions.

FURTHER READING

Solid-state dewetting of single-crystal thin films leads to an ordered array of particles that align along a few specific crystallographic orientations due to crystalline anisotropy. When single-crystal thin films are pre-patterned and then subjected to dewetting, which is known as templated dewetting, a regular array of complex features can be fabricated. The features that result from templated dewetting are affected by various instabilities that develop at the retracting edges of pre-patterns and the characteristics they produce. One instability that retracting edges can develop is pinch-off (see Figure 1a), which leads a wire parallel to the retracting edge; this process can occur repeatedly to form multiple wires. Alternatively, retracting edges can be subject to fingering instability (see Figure 1b), which leads to an array of wires aligned along the finger propagation direction. Understanding and controlling whether pinch-off or fingering occurs is important for controlled pattern formation.

In the past year we have demonstrated that the initial roughness of a film edge determines whether pinch-off or fingering occurs, with rough edges leading to fingering (Figure 1). To further understand this phenomenon and to control it, we patterned large rectangular patches, with edges having controlled patterned roughness to template the fingering instability (Figure 2a). The edges of the patches were also aligned along various in-plane crystallographic orientations to study the effects of crystalline anisotropy on the templated fingering instability. We have found that templating of edge roughness can cause a fingering instability, with a very narrow distribution of the width and period of the fingers and wire, and that the wavelength of patterned roughness can control the steady-state finger period (Figure 2b). We further found that the period of fingers affects the steady-state finger propagation velocity, so we developed a kinetic model that predicts steady-state finger propagation velocity as a function of the finger period. Strong effects of crystalline anisotropy on the templated fingering instability were observed. We found that edges that were aligned along a kinetically stable orientation resisted development of a fingering instability, even with the templating, and the patterned roughness disappeared as they retracted and became straight. Edges with orientations other than a kinetically stable orientation all developed fingering instabilities, but the finger propagation orientation was affected by the initial edge orientation; as a result, the steady-state finger period and propagation velocity were also affected. Furthermore, we studied effects of initial film thickness on the templated fingering instability using the same range of wavelengths of patterned roughness and the same range of in-plane orientations of the edge. During this study we found that the steady-state finger propagation velocity increases as film thickness decreases and that width of the wires that form due to propagation of the fingers decreases with film thickness, while the wavelength of patterned roughness still controls the finger period. Through these studies, we are developing techniques through which templated dewetting can be used as a patterning method.

![Figure 1](image1.png)  ▲ Figure 1: (a) Wire formed due to pinch-off during retraction of a well-defined straight edge (b) Wires formed due to a fingering instability during retraction of a rough edge. Scale: 10 μm

![Figure 2](image2.png)  ▲ Figure 2: Templated fingering instability (a) Edges having controlled patterned roughness (b) Controlled wire pattern formation through a templated fingering. Scale: 10 μm

**Further Reading**

The interface between metals and 2D materials (2DMs) influences device properties such as contact resistance, photoresponse, and high-frequency performance. In this project, we study the nucleation and growth of a variety of metals, including Ag, Au, Ti, Cr, and Nb, on 2DMs (graphene, hexagonal boron nitride (hBN), WSe2, MoS2). We use transmission electron microscopy (TEM) to provide direct insight into crystal size, shape and orientation, epitaxy, and diffusivity. Besides the basic parameters that affect growth mode and epitaxy such as diffusivity, binding, and cohesive energies, we also explore the effects of 2DM thickness, temperature during deposition, and substrate (SiO2, hBN, or suspended). Combining the knowledge of deposition conditions, templating, and nucleation control greatly enhances routes towards tailored interface design for emerging 2DM device applications.

Temperature during deposition greatly affects the diffusivity of metal atoms on the 2D surface. As expected from crystal growth models, temperature determines whether the crystal morphology is dendritic or compact and faceted on 2DMs (Figure 1). The effect of the substrate on the epitaxy and crystal morphology is relatively unexplored, and we find suspended 2DMs exhibit the largest epitaxial alignment (Figure 2). This is seen even for relative thick 2DMs, suggesting that substrate effects such as surface charges play little role in the crystal growth. Rather, 2DM roughness may be a determining parameter, which is decidedly lower for suspended 2DMs. In suspended layers, we also find that diffusion distance depends on 2DM thickness, with longest diffusion distances (>2 μm) on suspended Gr >8 monolayers thick. This project aims to contribute to the emerging field of 2D material devices through atomic scale characterization of metal nanocrystal growth on 2DMs, facilitating the design of contacts, heterostructures, and coupled materials for future 2DM dimensional devices.

**FURTHER READING**

Enabling Low-cost Electrodes in PbS Solar Cells through a Nickel Oxide Buffer Layer

E. Wassweiler, M. Sponseller, J. Jean, A. Osherov, M. Bawendi, V. Bulović
Sponsorship: NSF GRFP, Tata-GridEdge Solar

The versatile characteristics of lead sulfide quantum dots (PbS QD) make them an attractive material to develop high-efficiency, low-cost, and flexible photovoltaics (PVs). Hole transport layers (HTLs) and electron transport layers are essential building blocks in these solar cell architectures. PbS QDs with an EDT ligand are widely used as an HTL in high-efficiency QDPVs. However, the limited compatibility of the EDT with different electrode materials prevents the continued development of QDPVs into manufacturing capable device architectures. Specifically, the dependence on gold electrodes is cost-prohibitive for depositing QDPVs on a large scale.

While gold cannot be used on a commercial scale, less expensive but more chemically reactive materials can be used. Replacing gold with aluminum or copper would cut material costs by a factor of at least 1,200. Through the use of a nickel oxide (NiOx) buffer layer, these devices become compatible with lower-cost electrodes. As a p-type metal oxide, NiOx is a favorable HTL material with a high work function, large band gap, and film stability.

In fact, through the use of a NiOx buffer layer, power conversion efficiencies for devices with lower-cost electrodes are equivalent to their gold electrode counterparts. However, even though NiOx buffer layer devices show improved performance and stability compared to devices without NiOx buffer layers, the power conversion efficiency drops after a couple of months due to a new barrier within the device stack. Current research focuses on improving the stability of QDPVs with low cost electrodes through identifying and mitigating the barrier formation.

**FURTHER READING**

Photonics and Optoelectronics

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Artificial intelligence is becoming ubiquitous in our society; specifically, artificial deep neural networks (DNNs) have enabled breakthroughs in image classification, translation and prediction. The recent adoption of DNNs in a wide variety of fields is largely due to algorithms with improved accuracy that leverage more compute power and larger datasets. However, throughput and energy efficiency are currently limiting the further expansion and adoption of DNNs. We have proposed optical neural networks (ONNs), which we have theoretically shown to achieve low-energy, high-throughput DNN processing. Our latest results include a proof-of-concept demonstration of a digital ONN with little drop in classification accuracy on the MNIST dataset (~0.6% on a custom, fully-connected, 3-layer network, due to optical crosstalk). In this scheme, we use optics for passive digital data fan-out and routing. Owing to the length-independence of energy and latency in optical data transmission, we find that the digital ONN may enable more efficient DNN hardware. This work showcases the promise of ONNs as a new computing paradigm, which is required to unlock the full potential of DNNs.
The success of halide perovskites in a host of optoelectronic applications is often attributed to their long photoexcited carrier lifetimes, which has led to charge-carrier recombination processes being described as unique among semiconductors. Here, we integrate recent literature findings to provide a critical assessment of the factors we believe are most likely controlling recombination in the most widely studied halide perovskite systems. We focus on four mechanisms that have been proposed to affect measured charge-carrier recombination lifetimes, namely: (1) recombination via trap states, (2) polaron formation, (3) the indirect nature of the bandgap (e.g., Rashba splitting), and (4) photon recycling (Figure 1). We scrutinize the evidence for each case and the implications of each process for carrier recombination dynamics. Although they have attracted considerable speculation, we conclude that shallow trap states and the possible indirect nature of the bandgap (e.g., Rashba splitting), seem to be less likely given the combined evidence, at least in high-quality samples most relevant to solar cells and light-emitting diodes. On the other hand, photon recycling appears to play a clear role in increasing apparent lifetime for samples with high photoluminescence quantum yields. We conclude that polaron dynamics are intriguing and deserving of further study. We highlight potential interdependencies of these processes and suggest future experiments to better decouple their relative contributions. A more complete understanding of the recombination processes could allow us to rationally tailor the properties of these fascinating semiconductors and will aid the discovery of other materials exhibiting similarly exceptional optoelectronic properties.

Figure 1: Proposed mechanisms that may impact charge carrier recombination in perovskites: (a) trapping, (b) polaronic effects, (c) indirect bandgap character, and (d) photon recycling.

FURTHER READING

In this report, we demonstrate real-time, in-situ analysis of radiation damage in integrated photonic devices. The devices, integrated with an optical fiber array package and a baseline-correction temperature sensor, can be remotely interrogated while exposed to ionizing radiation over a long period without compromising their structural and optical integrity. We also introduce a method to deconvolve the radiation damage responses from different constituent materials in a device. The approach was implemented to quantify gamma radiation damage and post-radiation relaxation behavior of SiO2-cladded SiC photonic devices. Our findings suggest that densification induced by Compton scattering displacement defects is the primary mechanism for the observed index change in SiC. Additionally, post-radiation relaxation in amorphous SiC does not restore the original pre-irradiated structural state of the material. Our results further point to the potential of realizing radiation-hard photonic device designs taking advantage of the opposite signs of radiation-induced index changes in SiC and SiO2.

The devices fabricated following CMOS-compatible protocols are symmetrically cladded with PECVD SiO2. In device packaging, the as-fabricated devices were packaged with optical fiber arrays (SQS Vlaknova Optika) using ultraviolet-curable epoxy (Masterbond UV15TK) as the bonding agent. Fibers with an incident angle of 15° were first active aligned to the on-chip grating couplers to maximize the transmitted power. Epoxy was applied onto the chip to securely bond the fibers to the chip. The active alignment was repeated after epoxy application to ensure optimal coupling. The epoxy was then cured through flood UV exposure. We monitored the device resonance peak position and Q-factor as gamma radiation progressed. The refractive index and absorption coefficient change of a-SiC core and a-SiO2 cladding were extracted and plotted in Figure 1. As indicated in the graph, we clearly observe an opposite in signs of index change in these two materials, suggesting the potential of realizing radiation-hard photonic devices.

![Figure 1: In-situ measured changes of (a) refractive indices and (b) optical losses in SiC and SiO2 induced by gamma ray irradiation.](image)

**FURTHER READING**

Silicon photonics is a growing design platform due to all the potential applications and enhancements it can offer. Among these attractive applications are the significant computing system performance gains that can be achieved by transferring information using optical rather than electrical signals. Achieving this optical transmission requires on-chip optical buffers. Coupled resonator optical waveguides (CROWs), which chain a number of ring waveguides together as in Figure 1a, can be used as buffers.

However, CROWs are challenged by the spatial variations within die or across the wafer, as CROWs are large structures extending hundreds of microns to millimeters in length depending on the number of constituent rings. These variations can change the passband or, more importantly, may cause the CROW to fail if the spatial variations cause the resonances of the coupled rings to lose their alignment. Moreover, varying the ring (constituting a CROW) design requires regenerating the S-parameters, which is computationally expensive and time-consuming, if many variants need to be considered for Monte-Carlo statistical simulations or during design optimization. This highlights the need for a variation-aware compact model.

We develop a method and variation-aware compact models that can be used to simulate and predict the CROW behavior (S-parameters) against spatially correlated process variations in thickness and width. Figure 1b compares the simulated performance of a 28-ring CROW using S-parameters generated directly from FDTD simulation and using S-parameters generated using the developed compact model. This parameterized compact-model-generated S-parameters can be used to facilitate and speed up design optimization, run Monte-Carlo simulations, and predict yield. Figure 2 shows the yield prediction of CROWs satisfying a sufficient amplitude pass band (above -20dB), in response to width variation as a function of spatial correlation length ( ) and amplitude ( ). This compact model can serve as a building block for a variation-aware process design kit (PDK) for photonics.
Color cameras are ubiquitous in everyday life. However, most color imagers rely on color filter arrays (CFAs), resulting in most incoming light being filtered out instead of detected. More generally, for a filter-based imaging array with \( N \) different colors, only \( 1/N \) of the incoming light is actually used. While lossless spectral imagers are available, they rely on bulky optics such as diffraction gratings or interferometers to achieve spectral resolution, which is often undesirable. In the thermal IR wavelength range, the problem of filter loss is exacerbated by reduced sensor detectivity compared to visible light sensors.

We propose an efficient and compact thermal IR spectral imager based on a metasurface consisting of sub-wavelength-spaced, differently-tuned antennas with photosensitive loads. The different antenna resonances combine to yield broadband optical energy transfer to the loads exceeding the \( 1/N \) efficiency limit of CFAs. In particular, we investigate slot antennas due to their unidirectionality and high efficiency compared to typical dipole antennas. We use graphene as our photosensitive load because its 2D nature makes it easily adaptable to this imager architecture. To aid in the design of these slot antenna metasurfaces, we establish a circuit model for the optical properties of the antennas and demonstrate consistency between this model and full-wave electromagnetic simulations. We also show simulations results demonstrating broadband \( \sim 36\% \) free space to graphene coupling efficiency for a six-spectral-band metasurface. Finally, we demonstrate a fabrication process which yields slot antennas with smooth surfaces suitable for graphene transfer on top. This research represents the first steps towards compact, monolithic, and potentially CMOS-integratable mid-IR spectral imagers whose low bulk and low energy consumption suit them for deployment on small drones for remote sensing and free-space communication purposes.

![Figure 1](image_url)

**Figure 1:** a) Multispectral metasurface absorber, with graphene loads color-coded by center wavelength. b) Incident light to graphene power transfer efficiency spectrum of metasurface. c) SEM of fabricated gold slots with suspended graphene film.

**FURTHER READING**

State-of-the-art perovskite materials demonstrate photoluminescence quantum efficiencies (PLQE) above 90% due to low non-radiative recombination rates and unparalleled defect tolerance. The optoelectronic properties that have allowed perovskites to emerge as a leading active layer material in high-efficiency thin-film photovoltaics (PVs)–high absorption coefficient, small Stokes shift, high PLQE, solution processability, and chemical tunability–simultaneously situate perovskites to function superbly as a coherent quantum material. In this work, we explore perovskites as a platform for strong light-matter coupling to sustain all-optical operations. Although light is weakly interacting, it is possible to form interacting quasi-particles, called exciton-polaritons, that have characteristics of both light and matter. Traditionally, polaritons have been studied at cryogenic temperatures in all-inorganic semiconducting materials (e.g., GaAs heterostructures). Here, we study the room-temperature formation of exciton-polaritons with large Rabi splittings in semiconductor microcavities, using solution-processed 2D perovskites as self-assembled quasi-quantum well structures (Figure 1). Polariton formation is probed by angle resolved reflectivity and photoluminescence measurements through a k-space imaging setup. Enhanced polariton propagation is explored by microstructuring the microcavity to funnel polaritons generated in smaller cavity length regions to lower confined photon energy regions of longer cavity length. The realization of stable, facilely-fabricated room-temperature exciton-polaritons has the potential to revolutionize a wide range of devices, from PVs to low-threshold lasers to all-optical switches.
Amorphous Silicon Carbide for Nonlinear Integrated Photonics

D. Ma, P. Xing, K. Ooi, J. Choi, L. Kimerling, D. Tan, A. Agarwal
Sponsorship: Defense Threat Reduction Agency Grant No. HDTRA1-13-1-0001

Silicon carbide (SiC) has been actively researched in recent years as a platform for linear and nonlinear photonics due to its large bandgap, large refractive index, low thermo-optic coefficient, excellent mechanical and chemical stability, and large Kerr nonlinearity. We have demonstrated amorphous SiC waveguides with propagation losses as low as 3 dB/cm, which enable their application in integrated photonics. We have demonstrated amorphous SiC ring-resonators on SiO₂ insulator substrate with an intrinsic quality factor as high as 1.6 × 10⁵. The Kerr nonlinearity obtained at 1550-nm wavelength was 4.8 × 10⁻¹⁴ cm²/W, which was the highest value reported in both crystalline and amorphous SiC material, making it a promising platform for CMOS-compatible nonlinear photonics.

The amorphous SiC photonic devices were fabricated in the MIT.nano cleanroom facilities. A plasma-enhanced chemical vapor deposition (PECVD) system using a silane and methane reactive gas mixture was used to deposit an amorphous SiC thin film on a 6-inch Si wafer that had a 3-µm thermal oxide insulating layer. Electron beam lithography was used to pattern the SiC-on-insulator ring resonators. Fluorine chemistry was used to dry etch SiC using reactive ion etching. We characterized the optical properties of the amorphous SiC photonic devices in collaboration with Dr. Peng Xing and Professor Dawn Tan at the Singapore University of Technology and Design (SUTD) and achieved the largest quality factor among all crystalline and amorphous SiC materials tested to date. The Kerr coefficient of the amorphous SiC film was extracted by fitting the nonlinear Schrödinger equation. The Kerr nonlinearity measured in our amorphous SiC is almost one order of magnitude higher than that reported in the literature for crystalline and amorphous SiC. Nonlinear behavior was observed for the first time for a-SiC at the wavelength of 1550 nm, with a high incident pulse peak power.

FURTHER READING
High Sensitivity Mid-Infrared/Thermal Detectors

E. McVay, Y. Lin, A. Zubair, T. Palacios
Sponsorship: MIT-ARL ISN, NASA NSTRF

Infrared detectors that are fast, high-detectivity, and room-temperature-operable are needed to enable next-generation hyperspectral arrays. While photoconductor (pc) detectors can achieve high detectivity and ~100 ps time constants, pc detectors suffer from a narrow spectral range and must be cooled to cryogenic temperatures for efficient detection beyond ~ 4 µm wavelength. Thermal detectors, meanwhile, exhibit a flat detectivity response with respect to wavelength and can, ideally, reach a detectivity of 1.98*10^10 cmHz^1/2W^-1 at room temperature. In this work we focus on two sensitive novel thermal detector architectures: (1) a nanogap based thermomechanical bolometer and (2) a pyroelectric gated field-effect transistor (FET) biased in the subthreshold regime.

The thermomechanical (thm) bolometer achieves high sensitivity by closing a ~1.3-nm gap as the surrounding materials expand due to infrared light absorption, resulting in an exponential increase in current. The suspended thm bolometer is made of two metal cantilever arms connected by a 5-nm-thick platinum wire (see Figure 1). The nanogap detectors are mechanically stabilized via a self-assembled monolayer (SAM). Early experimental results show temperature coefficient of resistance (TCR) values as high as 0.16 K^-1, which is higher than the state-of-the-art ~ 0.1 K^-1. Studies to characterize the noise of these devices, measure their response to laser illumination, and determine their detectivity are in progress.

We are also exploring an additional low-power and sensitive bolometer design using subthreshold, pyroelectric gated thin-film transistors. When infrared light is absorbed, dipole charges in the pyroelectric material align and gate the transistor channel. We estimate that these devices can achieve TCR values of 0.6275/I_0 K^-1, where I_0 is the bias current. The proposed device structure can be found in Figure 2. We are currently exploring the design space of Hf_0.5Zr_0.5O_2 ferroelectric/pyroelectric FETs and optimizing them for 5 µm – 10 µm wavelength detection.

**FURTHER READING**

3D photonics promises to expand the reach of photonics by enabling both the extension of traditional applications to non-planar geometries and adding novel functionalities that cannot be attained with planar devices. However, current fabrication methods limit the range of available materials options (e.g. to low index contrast polymers for 3D printing) or device geometries (e.g. to curvilinear geometries that are inherently 2D in topology). As an application example, the much-needed ability to monitor stress in biological samples such as cell cultures and tissue models requires a platform that provides precise measurements at multiple, pre-defined locations in 3D, which none of the current fabrication methods for 3D integrated photonics can offer.

In this work, we report a fully-packaged 3D integrated photonics platform with devices placed at arbitrary pre-defined locations in 3D using a fabrication process that capitalizes on the buckling of a 2D pattern. The final structure consists in several buckled strips joining two planar edge platforms, as shown on Figure 1a. Each strip may contain waveguides and waveguide-coupled components such as resonators. We show that our fabricated devices (see Figure 1b) precisely match theoretical shapes. Finally, we demonstrate the amenability of this platform for mechanical strain sensing, e.g. in 3D cell cultures, by calibrating its stress-sensing response. Our results indicate a strain measurement accuracy of 0.01%, for materials with a Young's modulus down to 300 Pa.

A key benefit of our fabrication approach for 3D integrated photonics lies in the wide range of physical and chemical sensing applications of optical resonators, as well as the possibility to multiplex resonators spectrally and spatially. Our platform is thus amenable to monitoring a variety of parameters at a large number of locations in a distributed sensor array, potentially enabling multifunctional sensing, mapping, and light delivery in the 3D space.
Single-element, Aberration-free Fisheye Metalens

Sponsorship: DARPA EXTREME Program

Wide-angle optical functionality is crucial for implementation of advanced imaging and image projection devices. Conventionally, wide-angle operation is attained with complicated assembly of multiple optical elements. Recent advances in nanophotonics have led to metasurface lenses or metalenses, a new class of ultra-thin planar lenses utilizing subwavelength nanoantennas to gain full control of the phase, amplitude, and/or polarization of light. Here we present a novel metalens design capable of performing diffraction-limited focusing and imaging over an unprecedented $>170^\circ$ angular field of view (FOV). Similar to a Chevalier landscape lens, our metalens design concept spatially decouples the metasurface and aperture stop, but positions them on a common, planar substrate (Fig. 1a). This optical architecture allows input beams incident at various angles (indicated with colored arrows in Fig. 1a) to be captured on distinct yet overlapping areas of the metasurface. The metasurface further forms the pencil-beams, in such a way, that all of the focal spots are positioned in the same image plane.

We fabricated the metasurface using PbTe meta-atoms of rectangular and H-shaped blocks, which induce distinct phase shifts arising from the electric and magnetic resonant multipole modes (Figure 1b). The meta-atom library consisted of eight elements covering the $360^\circ$ phase space with a discrete step of $45^\circ$ for linearly polarized light at the mid-infrared wavelength of $5.2 \mu m$. The implemented metalens produced diffraction limited focal spots when illuminated with a laser beam at the incident angles ranging from 0 to $85^\circ$. We further demonstrated that the metalens can perform aberration-free imaging of the USAF resolution charts over the entire FOV. Our metalens design concept is generic and can be readily adapted to other meta-atom geometries and wavelength ranges to meet diverse application demands. In the scope of this project, we also explored machine learning approaches to generate free-form metalens designs with improved performance.

![Figure 1: (a) Schematic of ‘fisheye’ metalens and (b) images of the fabricated metasurface composed of lead telluride (PbTe) nanostructures on a calcium fluoride substrate.](image)

FURTHER READING

Ultra-sensitive All-optical Membrane Transducers for Photoacoustics

R. Singh, A. Agarwal, B. Anthony

Photoacoustic imaging (PAI) has attracted much attention over the past two decades for various biomedical imaging applications. However, it is surprising to note that this unique imaging modality has not yet spun out much in commercial applications. One of the key obstacles in this direction is the limited sensitivity of the currently available ultrasound transducers. Existing acoustic transducer technologies based on bulk PZT, piezoelectric, and capacitive micromachined ultrasonic transducers have a significantly low sensitivity in orders of 0.2 – 2.0 mPa/sqrt(Hz). This feature limits the imaging depth, reliability, and molecular sensitivity of the current PAI systems.

Our research work explores on-chip CMOS-compatible all-photonic architecture to develop PAI systems with significantly improved sensitivities, improved detection limits, and reduced power consumption. Spiral-shaped silicon nitride waveguides realized on suspended silicon-oxide membranes designed to have a center frequency between 5 MHz to 10 MHz are used as Mach-Zender arms for highly sensitive ultrasound reception with <1 mPa/sqrt(Hz) noise equivalent pressure. Hence, this approach allows fast intensity-based acquisition as opposed to interferometric acquisition, thus allowing on-chip optical interrogation. A few previously reported attempts in this direction have been limited to a single sensor element. Here, we attempt to leverage the benefits of existing photonic-based signal conditioning schemes and adopt them to multiplex the ultrasound reception from multiple sensor elements. The presented transducer technology has a multitude of advantages. Ultra-high sensitivity combined with an all-optical implementation will allow easy scaling-up of the technology and miniaturization for wearable applications.
Quantum technologies can potentially offer dramatic speed-up and enhanced security in information processing, communication, and sensing. Such tasks would require the scalable construction and control of a large number of quantum bits (qubits). Here, we report the fabrication and characterization of the largest integrated artificial atom-photonic chip.

Defects such as color centers in diamond behave like “artificial atom” (AA) spin qubits in that they can be controlled via light and microwaves and can maintain long coherence times. Scaling such systems requires (1) high-yield qubit fabrication, (2) efficient photonic wires to route and manipulate single photons, and (3) post-tuning capability to compensate for inhomogeneities between different qubit modules.

Rather than fabricating a low-yield monolithic system with these necessary requirements, we introduced the heterogeneous integration of “quantum micro-chiplets” (QMCs) into an integrated photonics process. The QMC (Figure 1A) consists of AA qubits in a diamond waveguide array, while the photonic integrated circuit (PIC) is an aluminum nitride (AlN)-on-sapphire platform. We used a pick-and-place process to transfer the QMCs in diamond to the AlN photonics chip with success probability over 90% (Figure 1B). As Figure 1C shows, the diamond and AlN modules meet at tapered waveguide interfaces for efficient photon routing from the diamond layer to the integrated photonics layer.

Room temperature and cryogenic measurements reveal single-photon emission in all 128 integrated waveguide channels (Figure 2). Additionally, the emitters exhibit near-lifetime-limited linewidths, indicating high optical coherence of emitters in nanostructures. Finally, we demonstrated on-chip tuning of the qubit optical transitions via strain fields in the waveguide. Our platform paves the way for on-chip generation and manipulation of large entangled quantum states and demonstrates the scalability of optically active spin qubits in solids for quantum information processing.
When two metal films stack together forming “hetero-film,” it has been generally accepted that the effective transparency is lower than in the respective metal film as a result of the absorption accumulation. In this work, we investigated the counterintuitive transmittance enhancement of graphene/aluminum hetero-films. Single layer graphene was first grown by chemical vapor deposition and transferred on SiO2 substrate. Subsequently, an aluminum coating with a thickness of 4-20 nm was produced by an e-beam evaporator with a target of 99.99% pure aluminum. We acquired the transmittance spectra of graphene/aluminum hetero-films using a UV-vis-NIR spectrophotometer. One interesting observation is that transmittance increased in samples with graphene, indicating a novel physical or chemical interaction between graphene and aluminum. For 4-nm Al film, graphene induced transparency enhancement at UV range of 200 to 300 nm. As film thickness increases to 8 nm, the transparency enhancement extends to a wider UV range of 10-660 nm. In a 12-nm sample, we observe an averaged 12% increase in transmittance for the wavelength range of 500-2500 nm in the sample with graphene, compared with a pure Al coating on the substrate. More surprisingly, similar transparency enhancement is captured when Al film was deposited on the graphene film. Due to the counterintuitive observation, we anticipate this work will benefit the community in fundamental understanding and reliable utilization of graphene and Al interactions.

**FURTHER READING**

Decomposed Representation of S-Parameters for Analysis of Silicon Photonic Variation

Z. Zhang, S. I. El-Henawy, D. S. Boning
Sponsorship: AIM Photonics

Silicon photonics offers great potential for monolithic integrated photonic and electronic components using existing integrated circuit (IC) fabrication infrastructure. However, methods to analyze the impact of IC process variations on performance of photonic components remain limited.

Statistical models based on either simulations or experiments that quantify the effect of these variations are necessary to achieve high-yield manufacturing. To cope with the non-linearity in the S-parameters of photonic device components and circuits, non-linear parameter fitting is often used prior to statistical modeling, e.g., rational polynomial fitting of ring resonator responses. The traditional approach treats the amplitude and phase of the S-parameters separately in the fitting process; however, this method can be problematic when the behavior of the S-parameters becomes complicated under the variations since it neglects the strong correlation between amplitude and phase. For example, the seemingly complicated spike in group delay shown in Figure 1 is actually where a smooth S-parameter accidentally crosses the origin point.

We present a novel representation of S-parameters that decomposes the complex-numbered S-parameters into several components, each having a simple response that does not require non-linear parameter fitting and that supports subsequent statistical analysis. We apply the proposed S-parameter decomposition method to Y-splitters with imposed line edge roughness (LER) variations. In contrast to the difficulty of the traditional amplitude-phase representation, the decomposed representation shows improvement in statistical modeling of variation ensembles, e.g., using principle component analysis (PCA) (Figure 2).

The method can be extended to other photonic components and circuits with other process variations to help quantify the effect of process variations for statistical analysis and to help designers predict and optimize photonic component performance and yield.

FURTHER READING
Research Centers

Center for Integrated Circuits and Systems ............................................................................................................................. 158
MIT/MTL Center for Graphene Devices and 2-D Systems ........................................................................................................ 159
MIT/MTL Gallium Nitride (GaN) Energy Initiative ................................................................................................................... 160
The MIT Medical Electronic Device Realization Center ......................................................................................................... 161
The Center for Integrated Circuits and Systems (CICS) at MIT, established in 1998, is an industrial consortium created to promote new research initiatives in circuits and systems design, as well as to promote a tighter technical relationship between MIT’s research and relevant industry. Nine faculty members participate in the CICS: Director Hae-Seung (Harry) Lee, Anantha Chandrakasan, Ruonan Han, Song Han, David Perreault, Negar Reiskarimian, Max Shulaker, Charles Sodini, and Vivienne Sze.

CICS investigates a wide range of circuits and systems, including wireless and wireline communication, high-speed, THz, and RF circuits, microsensor/actuator systems, imagers, digital and analog signal processing circuits, biomedical circuits, deep learning systems, emerging technologies, and power conversion circuits, among others.

We strongly believe in the synergistic relationship between industry and academia, especially in practical research areas of integrated circuits and systems. CICS is designed to be the conduit for such synergy.

CICS’s research portfolio includes all research projects that the eight participating faculty members conduct, regardless of source(s) of funding, with a few exceptions.

Technical interaction between industry and MIT researchers occurs on both a broad and individual level. Since its inception, CICS recognized the importance of holding technical meetings to facilitate communication among MIT faculty, students, and industry. We hold two informal technical meetings per year open to CICS faculty, students, and representatives from participating companies. Throughout each full-day meeting, faculty and students present their research, often presenting early concepts, designs, and results that have not been published yet. The participants then offer valuable technical feedback, as well as suggestions for future research. More intimate interaction between MIT researchers and industry takes place during work on projects of particular interest to participating companies. Companies may invite students to give on-site presentations, or they may offer students summer employment. Additionally, companies may send visiting scholars to MIT or enter into a separate research contract for more focused research for their particular interest. The result is truly synergistic, and it will have a lasting impact on the field of integrated circuits and systems.
MIT/MTL Center for Graphene Devices and 2-D Systems

Professor Tomás Palacios, Director

The MIT/MTL Center for Graphene Devices and 2-D Systems (MIT-CG) brings together MIT researchers and industrial partners to advance the science and engineering of graphene and other two-dimensional (2-D) materials.

Two-dimensional materials are revolutionizing electronics, mechanical and chemical engineering, physics and many other disciplines thanks to their extreme properties. These materials are the lightest, thinnest, strongest materials we know of. At the same time that they have extremely rich electronic and chemical properties. MIT has been leading research on the science and engineering of 2-D materials for more than 40 years. Since 2011, the MIT/MTL Center for Graphene Devices and 2-D Systems (MIT-CG) has played a key role in coordinating most of the work going on at MIT on these new materials, and in bringing together MIT faculty and students, with leading companies and government agencies interested in taking these materials from a science wonder to an engineering reality.

Specifically, the Center explores advanced technologies and strategies that enable 2-D materials, devices, and systems to provide discriminating or breakthrough capabilities for a variety of system applications ranging from energy generation/storage and smart fabrics and materials to optoelectronics, RF communications, and sensing. In all these applications, the MIT-CG supports the development of the science, technology, tools, and analysis for the creation of a vision for the future of new systems enabled by 2-D materials.

Some of the many benefits of the Center’s membership include complimentary attendance to meetings, industry focus days, and live webcasting of seminars related to the main research directions of the Center. Our industrial members also gain access to a resume book that connects students with potential employers, as well as access to timely white papers on key issues regarding the challenges and opportunities of these new technologies. There are also numerous opportunities to collaborate with leading researchers on projects that address some of today’s challenges for these materials, devices, and systems.
The MIT/MTL Gallium Nitride (GaN) Energy Initiative (MIT GaN) is an interdepartmental program that brings together 10 MIT faculty and more than 40 other researchers and industrial partners to advance the science and engineering of GaN-based materials and devices for energy applications.

The GaN Energy Initiative provides a holistic approach to GaN research for energy applications, and it coordinates work on the growth, technology, novel devices, circuits, and systems to take full advantage of the unique properties of GaN. The GaN Energy Initiative is especially interested in developing new beyond-state-of-the-art solutions to system-level applications in RF power amplification, mixed signal electronics, energy processing, and power management, as well as advanced optoelectronics. Most of the work is done on GaN materials and devices that are compatible with Si fabrication technologies, in close collaboration with industrial partners to accelerate the insertion of these devices into systems.

The MIT/MTL Gallium Nitride (GaN) Energy Initiative organizes numerous activities to advance the understanding of GaN materials, technology, and devices. Some of these activities include webcast of seminars and annual meetings, as well as joint collaborations with industry partners. The Initiative also elaborates a resume book of graduating students and provides timely access to white papers and pre-prints through its website.
The vision of the MIT Medical Electronic Device Realization Center (MEDRC) is to revolutionize medical diagnostics and treatments by bringing health care directly to the individual and to create enabling technology for the future information-driven healthcare system. This vision will, in turn, transform the medical electronic device industry. Specific areas that show promise are wearable or minimally invasive monitoring devices, medical imaging, portable laboratory instrumentation, and the data communication from these devices and instruments to healthcare providers and caregivers.

Rapid innovation in miniaturization, mobility, and connectivity will revolutionize medical diagnostics and treatments, bringing health care directly to the individual. Continuous monitoring of physiological markers will place capability for the early detection and prevention of disease in the hands of the consumer, shifting to a paradigm of maintaining wellness rather than treating sickness. Just as the personal computer revolution has brought computation to the individual, this revolution in personalized medicine will bring the hospital lab and the physician to the home, to emerging countries, and to emergency situations. From at-home cholesterol monitors that can adjust treatment plans, to cell phone-enabled blood labs, these system solutions containing state-of-the-art sensors, electronics, and computation will radically change our approach to health care. This new generation of medical systems holds the promise of delivering better quality health care while reducing medical costs.

The revolution in personalized medicine is rooted in fundamental research in microelectronics from materials to sensors, to circuit and system design. This knowledge has already fueled the semiconductor industry to transform society over the last four decades. It provided the key technologies to continuously increase performance while constantly lowering cost for computation, communication, and consumer electronics. The processing power of current smart phones, for example, allows for sophisticated signal processing to extract information from this sensor data. Data analytics can combine this information with other patient data and medical records to produce actionable information customized to the patient’s needs. The aging population, soaring healthcare costs, and the need for improved healthcare in developing nations are the driving force for the next semiconductor industry’s societal transformation, Medical Electronic Devices.

The successful realization of such a vision also demands innovations in the usability and productivity of medical devices, and new technologies and approaches to manufacturing devices. Information technology is a critical component of the intelligence that will enhance the usability of devices; real-time image and signal processing combined with intelligent computer systems will enhance the practitioners’ diagnostic intuition. Our research is at the intersection of Design, Healthcare, and Information Technology innovation. We perform fundamental and applied research in the design, manufacture, and use of medical electronic devices and create enabling technology for the future information-driven healthcare system.

The MEDRC has established a partnership between microelectronics companies, medical device companies, medical professionals, and MIT to collaboratively achieve needed radical changes in medical device architectures, enabling continuous monitoring of physiological parameters such as cardiac vital signs, intracranial pressure, and cerebral blood flow velocity. MEDRC has 4 sponsoring companies, 8 faculty members, 12 active projects, and approximately 15 students. A visiting scientist from a project’s sponsoring company is present at MIT. Ultimately this individual is the champion that helps translate the technology back to the company for commercialization and provide the industrial viewpoint in the realization of the technology. MEDRC projects have the advantage of insight from the technology arena, the medical arena, and the business arena, thus significantly increasing the chances that the devices will fulfill a real and broad healthcare need as well as be profitable for companies supplying the solutions. With a new trend toward increased healthcare quality, disease prevention, and cost-effectiveness, such a comprehensive perspective is crucial.

In addition to the strong relationship with MTL, MEDRC is associated with MIT’s Institute for Medical Engineering and Science (IMES) that has been charged to serve as a focal point for researchers with medical interest across MIT. MEDRC has been able to create strong connections with the medical device and microelectronics industry, venture-funded startups, and the Boston medical community. With the support of MTL and IMES, MEDRC will serve as the catalyst for the deployment of medical devices that will reduce the cost of healthcare in both the developed and developing world.
Faculty Profiles

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Anuradha M. Agarwal
Principal Research Scientist
Materials Research Laboratory
Leader, Lab for Education and Application Prototypes (LEAP), AIM Photonics Academy

Planar, integrated, Si-CMOS-compatible microphotonics platform for on-chip MIR hyperspectral imaging and chem-bio sensing applications; radiation effects on silicon microphotonics; non-linear materials and devices; chalcogenide glasses; aerosol detection; Lead Chalcogenide
Rm. 13-4126 | 617-253-5302 | anu @ mit . edu

GRADUATE STUDENTS
Danhao Ma, DMSE
Eveline Postelnicu, DMSE
Robin Singh, (co-advisor) ME
Katherine Stoll, DMSE
Drew Weninger, DMSE

VISITORS
Emanuele Guglielmi, Progetto Rocca Scholar
Melvin Nunez, NSF-REU Scholar
Brahmin Thurber-Carbone, BSU Bartlett Fellow

SUPPORT STAFF
Cindy Higgins, Administrative Assistant

SELECTED PUBLICATIONS


Akintunde I. (Tayo) Akinwande  
Professor of Electrical Engineering  
Department of Electrical Engineering & Computer Science

POSTDOCTORAL ASSOCIATES
Winston Chern, MTL  
Olusoji Ilori, MTL  
Girish Rugubor, MTL

GRADUATE STUDENT  
Nedeljko Karaulac, EECS

UNDERGRADUATE STUDENTS
Lay Jain, Physics  
Jack Bouhanna, EECS  
Olutimilehin O. Omotunde, EECS  
Álvaro Sahagún, EECS, University of Illinois at Chicago

SUPPORT STAFF
Steven O’Hearn, Administrative Assistant

SELECTED PUBLICATIONS

G. Rughoobur and A. I. Akinwande, "Arrays of Si Field Emitter Individually Regulated by Si Nanowires High Breakdown Voltages and Enhanced Performance," 31st International Vacuum Nanoelectronics Conference (IVNC), pp. 1–2, 2018


Empty space electronics. Nano vacuum channel transistors. Chip scale scale electron, ion, neutron and x-ray sources for imaging and sensing. Micro and nano structures for charged particle beams.

Rm. 39-553 | 617-258-7974 | akinwand @ mtl . mit . edu
Polina Anikeeva  
Associate Professor  
Department of Materials Science and Engineering  
Department of Brain and Cognitive Sciences

Neuroprosthetic materials and devices: chemistry, device physics, fabrication, and testing in biological systems. Minimally invasive neural stimulation.

Rm. 36-849 | 617-253-3301 | anikeeva@mit.edu

POSTDOCTORAL ASSOCIATES
- Danijela Gregurec, RLE
- Mehmet Kanik, RLE
- Siyuan Rao, RLE, K99/R00 NIH Pathway to Independence Awardee
- Dekel Rosenfeld, RLE, Tan-Yang Fellow
- Dena Shahriari, RLE, Craig H. Nielsen Fellow

GRADUATE STUDENTS
- Marc-Joseph Antonini, HST, Friends of McGovern Fellow
- Florian Koehler, EECS
- Youngbin Lee, DMSE, Kwangejong Fellow
- Junsang Moon, DMSE, Samsung Fellow
- Jimin Park, DMSE, Kwangejong Fellow
- Indie Rice, HST, NSF Fellow
- Atharva Sahasrabudhe, Chemistry, Lore McGovern Fellow
- Alexander Senko, DMSE, NDSEG Fellow
- Anthony Tabet, ChemE, NSF Fellow, Soros Fellow

UNDERGRADUATE STUDENTS
- Melissa Hummel, DMSE
- Cindy Shi, DMSE
- Melissa Stok, DMSE

VISITOR
- Ian Tafel, Brigham and Women’s Hospital

SUPPORT STAFF
- Cindy Higgins, Administrative Assistant

SELECTED PUBLICATIONS
Duane S. Boning
Clarence J. LeBel Professor of Electrical Engineering
Professor of Electrical Engineering & Computer Science
Department of Electrical Engineering & Computer Science

Design for manufacturability of processes, devices, and circuits. Understanding variation in semiconductor, photonics and MEMS manufacturing, emphasizing statistical, machine learning, and physical modeling of spatial and operating variation in circuits, devices, and CMP, electroplating, spin coating, etch, and embossing processes.

Rm. 39-415a | 617-253-0931 | boning@mit.edu

VISITORS
David Pan, University of Texas at Austin
Mokmin Park, Samsung

GRADUATE STUDENTS
David Amirault, EECS
Hongge Chen, EECS
Felix Dumont, EECS and Sloan
Sally El-Henawy, EECS
Christopher Lang, EECS
Christopher Lui, EECS and Sloan
Damien Martin, EECS
Bidusha Poudyal, EECS and Sloan
Tareq Saqr, SDM
Fan-Keng Sun, EECS
Zoe Wolszon, EECS and Sloan
Zhengxing Zhang, EECS

SUPPORT STAFF
Jami L. Mitchell, Administrative Assistant

SELECTED PUBLICATIONS


Edward S. Boyden  
Y. Eva Tan Professor in Neurotechnology at MIT  
McGovern Institute, Media Lab, and Koch Institute  
Department of Biological Engineering  
Department of Brain and Cognitive Sciences

Developing tools that enable the mapping of the molecules and wiring of the brain, the recording and control of its neural dynamics, and the repair of its dysfunction. Systematically analyzing and repairing normal and pathological brain computations.

Rm. E15-485 / 46-2171C | 617-324-3085 | edboyden @ mit . edu

RESEARCH SCIENTISTS AND STAFF
Bobae An, Media Lab  
Yi Cui, Media Lab  
Burcu Guner, Media Lab  
Jennifer Fehring, Media Lab  
Manos Karagiannis, Media Lab  
Kylie Leung, Media Lab  
Shubhra Pandit, Media Lab  
Demian Park, Media Lab  
Or Shemesh, Media Lab  
Doug Weston, Media Lab  
Aimei Yang, Media Lab  
Jian-Ping Zhao, Media Lab

POSTDOCTORAL ASSOCIATES
Ruixuan (Rui) Gao, MAS  
Jinyoung Kang, MAS  
Kristina Kitko, MAS  
Changyang Linghu, MAS  
Yangning Lu, MAS  
Yong Qian, MAS  
Nava Shmoel, BCS  
Ho-Jun Suk, BCS  
Panagiotis (Panos) Symvoulidis, MAS  
Giovanni Talei Franzesi, MAS  
Oz Wassie, MAS  
Gaojie Yang, MAS  
Chi Zhang, MAS

GRADUATE STUDENTS
Jenna Aronson, BCS  
Nick Barry, MAS  
Orhan Celiker, EECS  
Alexi Choueiri, BCS  
Danielle Cosio, BCS  
Amauche Emenari, BCS  
Daniel Estandian, BCS  
Daniel Goodwin, MAS  
Kettner Griswold, MAS  
Jordan Harrod, HST  
Brennan Jackson, HST  
Shannon Johnson, MAS  
Yixi Liu, EECS  
Mitchell Murdoch, BCS  
Nikita Obidin, MAS  
Daniel Oran, MAS  
Andrew Payne, MAS  
Archana Podury, Harvard Medical  
Paul Reginato, BE

Cipriano Romero, EECS  
Margaret Schroeder, BCS  
Sarah Scilaris, MAS  
Tay Won Shin, MAS  
Anubhav Sinha, HST  
Mike Skuhersky, MAS  
Corban Swain, BE  
Cristina Torres Caban, BE  
Zeguan Wang, MAS  
Jay Yu, BE  
Ruihan Zhang, MAS

SUPPORT STAFF
Macey Lavoie, Administrative Assistant  
Lisa Lieberson, Senior Administrative Assistant  
Fira Zainal, Administrative Assistant

SELECTED PUBLICATIONS


Vladimir Bulović  
MIT.nano Director  
Fariborz Maseeh (1990) Professor of Emerging Technology  
Department of Electrical Engineering and Computer Science

RESEARCH SCIENTISTS
Jeremiah Mwaura, RLE  
Annie Wang, RLE

POSTDOCTORAL ASSOCIATES
Dane deQuilettes, RLE  
Benjia Dak Dou, RLE  
Maximilian Hoerantner, RLE  
Joel Jean, RLE  
Apoorva Murarka, RLE  
Anurag Panda, RLE

GRADUATE STUDENTS
Roberto Brenes, EECS, NSF Fellow  
Yumeng Melody Cao, EECS  
Matthew Ruiyan Chua, EECS, A*STAR Fellow  
Mingye Gao, EECS  
Jinch Han, EECS  
Madeline Laitz, EECS, NSF Fellow  
Melissa Li, EECS  
Thomas Mahony, EECS  
Mayuran Saravanapavanatham, EECS, NSF Fellow  
Melany Sponseller, EECS  
Richard Swartout, EECS  
Ella Wassweiler, EECS, NSF Fellow  
Sihan Jonas Xie, DMSE  
Ryan Zimmerman, MechEng  
Han Tony Zhu, Physics

VISITOR
Emma Belliveau, U. of Waterloo

SUPPORT STAFF
Samantha Farrell, Senior Administrative Assistant

PUBLICATIONS


**Jacopo Buongiorno**  
TEPCO Professor, Department of Nuclear Science and Engineering  
MacVicar Faculty Fellow  
Director, Center for Advanced Nuclear Energy Systems (CANES)  
Director of Science and Technology, Nuclear Reactor Laboratory (NRL)

Innovations in nuclear technology, boiling heat transfer, nuclear reactor design and safety, offshore floating nuclear power plant, nanofluids for nuclear applications.

Rm. 24-206 | 617-253-7316 | jacopo @ mit . edu

---

**GRADUATE STUDENTS**

Xyniao (Anna) Liang, NSE  
William Robbie Stewart, NSE  
Lorenzo Venneri, NSE  
Enrique Velez-Lopez, CEE

**UNDERGRADUATE STUDENTS**

Lisa Blomberg, NSE  
Abdalla Osman, MechE  
Kyle Thomson, NSE

**SUPPORT STAFF**

Carolyn Carrington, Administrative Assistant

**SELECTED PUBLICATIONS**


Anantha Chandrakasan
Dean of Engineering
Vannevar Bush Professor of Electrical Engineering & Computer Science
Department of Electrical Engineering and Computer Science

Design of digital integrated circuits and systems. Energy efficient implementation of signal processing, communication and medical systems. Circuit design with emerging technologies.

Rm. 38-107 | 617-258-7619 | anantha @ mit . edu

GRADUATE STUDENTS
Aya Amer, EECS (co-supervised by M. Shulaker)
Mohamed Radwan Abdelhamid, EECS
Maitreyi Ashok, EECS
Utsav Banerjee, EECS
Kaustav Brahma, EECS
Ruicong Chen, EECS (co-supervised by F. Adib)
Di-Chia Chueh, EECS (co-supervised by J. Glass)
Gloria (Yu Liang) Fang, EECS
Preetinder Garcha, EECS
Taehoon Jeong, EECS (co-supervised by H.-S. Lee)
Alex Ji, EECS
Harneet Khurana, EECS (co-supervised by H.-S. Lee)
Kyungmi Lee, EECS
Saurav Maji, EECS
Vipasha Mittal, EECS (co-supervised by H-S. Lee)
Rishabh Mittal, EECS (co-supervised by H-S. Lee)
Haripriya Mehta, EECS
Sirma Orguc, EECS (co-supervised by P. Anikeeva)
Joanna Sands, EECS
Miaorong Wang, EECS
Jongchan Woo, EECS

VISITING SCHOLARS
Chiraag Juvekar
Rabia Tugce Yazicigil, Boston University

SUPPORT STAFF
Margaret Flaherty, Senior Administrative Assistant

SELECTED PUBLICATIONS


Yufeng (Kevin) Chen
Assistant Professor of Electrical Engineering
Department of Electrical Engineering & Computer Science

Biomimetic Robotics, Insect-scale robots, intermediate Reynolds number fluid dynamics, unsteady aerodynamics, soft artificial muscles, electroactive polymer actuators

Rm. 10-140H | 617-253-7351 | yufengc@mit.edu

SUPPORT STAFF
Catherine Bourgeois, Administrative Assistant

SELECTED PUBLICATIONS


Luca Daniel  
Professor  
Department of Electrical Engineering & Computer Science  

Development of numerical techniques: parameterized model order reduction, uncertainty quantification, inverse problems and robust optimization for high dimension parameter spaces. Current applications: magnetic resonance imaging; electrical power distribution networks; robustness of deep neural networks

Rm. 36-849 | 617-253-2631 | luca@mit.edu

POSTDOCTORAL ASSOCIATES
Ian Butterworth, EECS  
Praneeth Namburi, EECS

GRADUATE STUDENTS
Samuel Chevalier, MechE  
Durgesh Das, LGO  
Ching-Yun (Irene) Ko, EECS  
Jeet Mohapatra, EECS  
Oliver Regele, LGO  
Jose E. C. Serralles, EECS  
Marco Turchetti, EECS  
Tsui-Wei (Lily) Weng, EECS  
Wang Zhang, MechE

UNDERGRADUATE STUDENTS
Akhilan Boopathy, EECS  
Juan Gil, EECS  
Alexander Gu, EECS  
Wonjune Kang, EECS  
Quang Kieu, EECS  
Tuomas Oikarinen, EECS  
Victor Rong, EECS

VISITORS
Roberta Bardini, Politecnico di Torino  
Tommaso Brade, Politecnico di Torino  
Marco De Stefano, Politecnico di Torino  
David Esseni, Univ. di Udine  
Stefano Grivet, Politecnico di Torino  
Giambattista Grusso, Politecnico di Milano  
Tommaso Rollo, Univ. di Udine  
Luca Schenato, Univ. di Padova

SUPPORT STAFF
Chadwick Collins, Administrative Assistant

SELECTED PUBLICATIONS


Jesús A. del Alamo
Donner Professor
Professor of Electrical Engineering
Department of Electrical Engineering & Computer Science

RESEARCH SCIENTIST
Alon Vardi, MTL

GRADUATE STUDENTS
Ebrahim Al Johani, EECS
Taek Yong Kim, EECS
Ethan Lee, EECS
Aviram Massuda, EECS
Murat Onen, EECS
Yanjie Shao, EECS

VISITORS
Luis Hurtado, U. Central Florida
Jin Soak Kim, Samsung Electronics
Yuval Epstein Ofek, Cooper Union
Moshe Tordjman, Technion
Claudia Vazquez Sanz, Universidad Politécnica de Madrid
Alice Wu, Columbia University

SUPPORT STAFF
Elizabeth Kubicki, Administrative Assistant

SELECTED PUBLICATIONS


Dirk R. Englund  
Assistant Professor  
Department of Electrical Engineering & Computer Science

---

**RESEARCH SCIENTISTS**

- Ryan Hamerly, RLE
- Mikkel Heuck, RLE

**POSTDOCTORAL ASSOCIATES**

- Jacques Carolan, Marie Curie Fellow  
- Chitraleema Chakraborty, RLE  
- Lorenzo De Santis, RLE  
- Carlos Errando Herranz  
- Laura Kim, IC Postdoctoral Fellow  
- Stefan Krastanov  
- Adrian Menssen, Humboldt Fellow  
- Matt Trusheim, ARL Postdoctoral Fellow

**GRADUATE STUDENTS**

- Saumil Bandyopadhyay, EECS, NSF Fellow  
- Eric Bersin, EECS, NTSRF fellow  
- Liane Sarah Bel Bernstein, NSERC Postgraduate Scholarship  
- Darius Bunandar, Physics  
- Uttara Chakraborty, EECS, NDSEG Fellow  
- Hyeongrak (Chuck) Choi  
- Kevin Chen, EECS, NSF Fellow  
- Ian Christen, NDSEG Fellow  
- Ronald Davis, RLE  
- Erik Eisenach, NSF Fellow  
- Christopher Foy, NSF fellow  
- Jordan Goldstein, NSF fellow  
- Zhen Guo  
- Isaac Harris, EECS  
- Donggyu Kim  
- Hugo Larocque, NSERC Postgraduate Scholarship  
- Tsung-Ju Lu, NDSEG Fellow  
- Hyowon Moon, EECS  
- Christopher Panuski, EECS, Hertz Fellow  
- Cheng Peng, EECS  
- Mihika Prabhu, EECS, NSF Fellow  
- Alex Sludts, EECS, NSF Fellow  
- Madison Sutula  
- Michael Walsh, EECS  
- Noel Wan, EECS  
- Reggie Wilcox

**UNDERGRADUATE STUDENT**

- Yuan Lee, EECS & Physics

**SUPPORT STAFF**

- Janice Balzer, Administrative Assistant

---

**SELECTED PUBLICATIONS**


Jongyoon Han
Professor
Department of Electrical Engineering & Computer Science
Department of Biological Engineering

Nanofluidic / Microfluidic technologies for advanced biomolecule analysis and sample preparation: cell and molecular sorting, novel nanofluidic phenomena, biomolecule separation and pre-concentration, seawater desalination and water purification, neurotechnology.

Rm. 36-841 | 617-253-2290 | jyhan @ mit . edu

POSTDOCTORAL ASSOCIATES
Hyungkook Jeon, RLE
Kerwin Keck, SMART Center
Hyukjin Kwon, RLE
Taehong Kwon, RLE
Yaoping Liu, SMART Center
Ishita Shrivastava, RLE
Smita Thamarath Surendran, SMART Center
Dahou Yang, SMART Center
Junghyo Yoon, RLE

GRADUATE STUDENTS
Alex Barksdale, EECS
Kyungyong Choi, EECS
Matthew Flavin, EECS
Wei Ouyang, EECS
Menglin Shang, SMART Center, NUS
Zhumei Sun, ME
Ching Ann Tee, SMART Center, NUS
Eric Wynne, EECS
Aoli Xiong, SMART Center, NTU

VISITORS
Eric Brack, Army Natick Research Center
Xiwei Huang, Hangzhou Dianzi University
Dongho Kim, Hanyang University, Korea
Tingyu Li, Peking University, China
Aniruddh Sarkar, Ragon Institute

SUPPORT STAFF
Cindy Higgins, Administrative Assistant

SELECTED PUBLICATIONS


Ruonan Han
Associate Professor
Department of Electrical Engineering & Computer Science

Integrated circuits and systems operating from RF to THz frequencies for sensing and communication applications. Electromagnetism, Chip-scale wave–matter interactions for miniature spectroscopy and frequency metrology.

Rm. 39-527a | 617-324-5281 | ruonan @ mit.edu

POSTDOCTORAL ASSOCIATE
Xiang Yi, MTL

GRADUATE STUDENTS
Mohamed Elsheikh, EECS
Jack Holloway, EECS
Zhi Hu, EECS
Mohamed I. Ibrahim, EECS
Mohamed I. Khan, EECS
Mina Kim, EECS (Co-supervised with Hae-Seung Lee)
Nathan Monroe, EECS
Cheng Wang, EECS
Jincheng Wang, EECS

UNDERGRADUATE STUDENT
James Quigley, EECS

VISITORS
Xibi Chen, Tsinghua University
Joshua Lewis, University of Illinois
Xingcun Li, Tsinghua University
Rui Ma, Mitsubishi Electric Research Labs

SUPPORT STAFF
Kathleen Brody, Administrative Assistant

PUBLICATIONS


**Song Han**  
Assistant Professor  
Department of Electrical Engineering & Computer Science

**Rm. 38-344 | 707-797-7288 | songhan @ mit.edu**

---

**GRADUATE STUDENTS**

Han Cai, EECS  
Ji Lin, EECS  
Yujun Lin, EECS  
Zhijian Liu, EECS  
Hanrui Wang, EECS

**UNDERGRADUATE STUDENT**

Joshua Noel, EECS

**VISITORS**

Muyang Li, Shanghai Jiaotong University  
Zhekai Zhang, Shanghai Jiaotong University  
Ligeng Zhu, Simon Fraser University

**SELECTED PUBLICATIONS**


H. Wang, K. Wang, J. Yang, L. Shen, N. Sun, H.-S. Lee and S. Han , "Transferable Transistor Sizing with Graph Neural Networks and Reinforcement Learning," *Design Automation Conference (DAC)*, 2020.


Juejun (JJ) Hu  
Associate Professor  
Department of Materials Science & Engineering

Integrated photonics, optical thin films, glass and amorphous materials, silicon photonics, light management in photovoltaics, magneto-optical isolation, integration on unconventional substrates (polymers, optical crystals, 2-D materials, etc.), infrared imaging, spectroscopy, metasurface.

Rm. 13-4054 | 302-766-3083 | hujuejun @ mit.edu

RESEARCH SCIENTIST
Tian Gu, MRL

POSTDOCTORAL ASSOCIATES
Qingyang Du, DMSE  
Jerome Michon, DMSE  
Carlos A. Rios Ocampo, DMSE  
Ying Pan, DMSE  
Mikhail Shalaginov, DMSE  
Shaoliang Yu, DMSE

GRADUATE STUDENTS
Skylar Deckoff-Jones, DMSE  
Tushar Karnik, DMSE  
Gillian Micale, DMSE  
Fan Yang, DMSE  
Yifei Zhang, DMSE

UNDERGRADUATE STUDENTS
Raja B. Azhar, DMSE  
Jeremy Dudo, DMSE  
Babatunde Ogunlade, DMSE

VISITORS
Samuel Serna, Bridgewater State University  
Xiaoming Qiu, Peking University

SUPPORT STAFF
Sandra Crawford, Administrative Assistant

SELECTED PUBLICATIONS


Qing Hu
Professor
Department of Electrical Engineering & Computer Science

Physics and applications of millimeter-wave, terahertz, and infrared devices.
Rm. 36-465 | 617-253-1573 | qhu @ mit . edu

COLLABORATORS
Jianrong Gao, Delft University
John L. Reno, Sandia National Lab.
Zbig Wasilewski, University of Waterloo
Gerard Wysocki, Princeton University

GRADUATE STUDENTS
Ali Khalatpour, EECS
Theodore Letsou, EECS
Andrew Paulsen, EECS
Elise Uyehara, EECS
Tianyi Zeng, EECS

SUPPORT STAFF
Shayne Fernandes, Administrative Assistant

SELECTED PUBLICATIONS


POSTDOCTORAL ASSOCIATE
Tianyi Han, MRL

GRADUATE STUDENTS
Matthew Yeung, EECS
Jixiang Yang, Physics
Qihang Zhang, EECS

UNDERGRADUATE STUDENT
Alex Smith, Physics

SUPPORT STAFF
Monica Wolf, Administrative Assistant

SELECTED PUBLICATIONS


Jeehwan Kim
Class ’47 Career Development Associate Professor
Department of Mechanical Engineering
Department of Materials Science and Engineering
Research Laboratory of Electronics

Two-dimensional material based layer transfer, brain-inspired neuromorphic computing,
single-crystalline graphene electronics, advanced photovoltaics.

Rm. 38-276 | 617-324-1948 | jeehwan@mit.edu

POSTDOCTORAL ASSOCIATES
Sanghoon Bae, MechE
Hyunseok Kim, MechE
Yeongin Kim, MechE
Wei Kong, MechE
Hyunseong Kum, MechE
Haneol Lee, MechE
Peng Lin, MechE
Jaewoo Shim, MechE
Jiho Shin, MechE
Hanwool Yeon, MechE

GRADUATE STUDENTS
Chanyeol Choi, EECS
Yunjo Kim, MechE
Sangho Lee, MechE
Yunpeng Liu, MechE
Kuangye Lu, MechE
Kuan Qiao, MechE
Scott Tan, MechE

SUPPORT STAFF
Emilie Heilig, Administrative Assistant

SELECTED PUBLICATIONS


Sang-Gook Kim
Professor
Department of Mechanical Engineering

Piezoelectric MEMS, AI for Design and Manufacturing
Rm. 1-306 | 617-452-2472 | sangkim @ mit . edu

GRADUATE STUDENT
Haluk Akay, DME

UNDERGRADUATE STUDENTS
Matt Moris, EECS
Nadia Waid, EECS

VISITING RESEARCH STAFF
Sergio A Navarro Tuch, Tecnologico de Monterrey

SUPPORT STAFF
Tony Pulsone, Administrative Assistant

SELECTED PUBLICATIONS


Jing Kong
MTL Associate Director
Professor of Electrical Engineering
Department of Electrical Engineering & Computer Science

Synthesis, characterization and applications of low-dimensional materials, including carbon nanotube, graphene and other two dimensional materials.

POSTDOCTORAL ASSOCIATES
Minghui (Hill) Chiu, RLE
Yunfan Guo, RLE
Qingqing Ji, RLE
Nannan Mao, RLE
JiHoon Park, RLE
Mahdi Tavakoli, RLE
Jiayuan Zhao, RLE

GRADUATE STUDENTS
Zhantao Chen, MechE
Marek Hempel, EECS
Jian-An(Jake) Ke, DMSE
Angyu Lu, EECS
Luiz Gustavo Pimenta Martins, Physics
Pin-Chun Shen, EECS
Cong Su, NSE
Haozhe Wang, EECS

VISITORS
Zhengyang Cai, Tsinghua University, China
Yongli Duan, China University of Petroleum, China
Weihua Mu, Wenzhou Institute of Biomaterials and Bioengineering, China
Jianbin Zhang, Inner Mongolia Univ. of Technology, China

SUPPORT STAFF
Arlene Wint, Administrative Assistant

SELECTED PUBLICATIONS


Xin Zeng, Jie Sun, Suping Li, Jiyun Shi, Han Gao, Wei Sun Leong, Yiqi Wu, Minghui Li, Chengxin Liu, Ping Li, Jing Kong, Yi-Zhou Wu, Guangjun Nie, Yuming Fu, Gen Zhang, “Blood-triggered Generation of Platinum Nanoparticle Functions as an Anti-cancer Agent,” Nature communications 11 (1), 1-12 (2020).


Jeffrey H. Lang  
Vitesse Professor of Electrical Engineering  
Department of Electrical Engineering & Computer Science

Analysis, design, and control of electro-mechanical systems with application to traditional rotating machinery and variable-speed drives, micro/nano-scale (MEMS/NEMS) sensors and actuators, flexible structures, and the dual use of actuators as force and motion sensors.

Rm. 10-176 | 617-253-4687 | lang @ mit . edu

POSTDOCTORAL RESEARCHER
Apoorva Murarka, RLE

GRADUATE STUDENTS
Benjamin Cary, EECS  
Mingye Gu, EECS  
Jinchí Han, EECS  
Sajjad Mohammadiyangijeh, EECS  
John Zhang, MechE

UNDERGRADUATE STUDENT
Daniel Sheen, EECS

SUPPORT STAFF
Donna Gale, Administrative Assistant  
Arlene Wint, Administrative Assistant

SELECTED PUBLICATIONS


POSTDOCTORAL ASSOCIATES
Matthew Hauwiller, DMSE
Dennis Kim, DMSE

GRADUATE STUDENTS
Xi Chen, DMSE
Abinash Kumar, DMSE
Aubrey Penn, NC State University
Michael Xu, DMSE

UNDERGRADUATE STUDENT
Gabriela Corea, DMSE

VISITOR
Anna Kaleta, Institute of Physics, Polish Academy of Sciences

SUPPORT STAFF
Julia Hollingsworth, Administrative Assistant

SELECTED PUBLICATIONS


Hae-Seung Lee
Director of Microsystems Technology Laboratories
Director of Center for Integrated Circuits and Systems
ATSC Professor of Electrical Engineering & Computer Science
Department of Electrical Engineering & Computer Science

Analog and Mixed-signal Integrated Circuits, with a Particular Emphasis in Data Conversion Circuits in scaled CMOS.
Rm. 39-521 | 617-253-5174 | hslee @ mtl . mit . edu

POSTDOCTORAL ASSOCIATE
Anand Chandrasekhar, EECS

GRADUATE STUDENTS
Ruicong Chen, EECS
Rebecca Ho, EECS
Taehoon Jeong, EECS
Harneet Singh Khurana, EECS
Jaehwan Kim, EECS
Mina Kim, EECS
Henry Love, EECS
Rishabh Mittal, EECS
Vipasha Mittal, EECS
Xi Yang, EECS

SUPPORT STAFF
Elizabeth Green, Senior Administrative Assistant
Elizabeth Kubicki, Administrative Assistant

SELECTED PUBLICATIONS


H.-S. Lee, "Non-switched Capacitor Circuits for Delta-sigma ADCs," U.S. Patent 10,469,098, Nov. 5, 2019

Luqiao Liu  
Associate Professor  
Department of Electrical Engineering & Computer Science  
Spintronics; spin based logic and memory device; nanoscale magnetic material for information storage and microwave application; fabrication technique of magnetic nanodevices; spin related phenomena in semiconductor, topological insulator, superconductors and low dimensional material; magnetic dynamics  
Rm. 39-553a | 617-253-0019 | luqiao @ mit . edu

POSTDOCTORAL ASSOCIATE  
Yabin Fan, MTL

GRADUATE STUDENTS  
Josh Chou, Physics  
Joseph Finley, EECS  
Jiahao Han, EECS  
Justin Hou, EECS  
Taqiyyah Safi, EECS  
Pengxiang Zhang, EECS

UNDERGRADUATE STUDENT  
Brooke C McGoldrick, EECS

VISITOR  
Junxiang Xiang, University of Science and Technology of China

SUPPORT STAFF  
Steven O'Hearn, Administrative Assistant

SELECTED PUBLICATIONS  


Scott R. Manalis  
Viterbi Professor  
Departments of Biological and Mechanical Engineering

POSTDOCTORAL ASSOCIATES
Georgios (Yorgos) Katsikis, KI  
Scott Knudsen, BE  
Teemu Miettinen, KI  
Luye (Mary) Mu, KI  
Peter Winter, KI  
Jiaquan (Jason) Yu, KI  
Ye Zhang, KI

GRADUATE STUDENTS
Alex Miller, HST  
Max Stockslager, MechE  
Weida (Richard) Wu, BE

UNDERGRADUATE STUDENT
Emily Ryeom, BE

STAFF
Lin Lin, KI  
Mahnoor Mirza, KI  
Nola Mulugeta, KI  
Jennifer Yoon, KI

SUPPORT STAFF
Mariann Murray, Administrative Assistant

SELECTED PUBLICATIONS


Farnaz Niroui  
Assistant Professor  
Department of Electrical Engineering & Computer Science

Nanofabrication techniques with a focus on achieving nanometer precision and resolution, utilizing emerging nanomaterials. Surfaces, interfaces and forces at the nanoscale. Active devices with applications in electromechanical systems, optoelectronics, and quantum technologies.

Rm. 13-3005B | 617-253-0085 | fniroui@mit.edu

GRADUATE STUDENTS
Peter Satterthwaite, EECS, NSF Fellow  
Spencer (Weikun) Zhu, ChemE

SUPPORT STAFF
Catherine Bourgeois, Administrative Assistant

SELECTED PUBLICATIONS


Tomás Palacios  
Professor  
Department of Electrical Engineering & Computer Science

Design, fabrication, and characterization of novel electronic devices and systems based on wide bandgap semiconductors & 2-D materials, polarization & bandgap engineering, transistors for high voltage, sub-mm wave power & digital applications.

Rm. 39-567a  | 617-324-2395  | tpalacios @ mit . edu

POSTDOCTORAL ASSOCIATES  
Yuxuan Lin, MTL  
Ahmad Zubair, MTL

GRADUATE STUDENTS  
Nadim Chowdhury, EECS  
Qiang Cui, EECS/SDM  
Marek Hempel, EECS  
Yiyue Luo, EECS, CSAIL  
Elaine McVay, EECS  
Ayrton Munoz, EECS  
John Niroula, EECS  
Joshua Perozek, EECS  
Pao-Chuan Shih, EECS  
Qingyun Xie, EECS  
Mantian Xue, EECS  
Mengyang Yuan, EECS  
Jiadi Zhu, EECS

UNDERGRADUATE STUDENTS  
Lokhin Cheng, SuperUROP  
Jaeyoung Jung, UROP  
Heyi Li, UROP  
Kevin Limanta, UROP  
Chenkai Mao, UROP  
Sarah Spector, SuperUROP  
Xingyu Zou, SuperUROP

VISITORS  
Marian Pampillon, Universidad Politecnica de Madrid  
Miguel Sanchez, Universidad Politecnica de Madrid  
Anthony Taylor, Edwards Vacuum  
Marisa Lopez Vallejo, Universidad Politecnica de Madrid  
Kohei Yoshizawa, DOWA

SUPPORT STAFF  
Joseph Baylon, Administrative Assistant

SELECTED PUBLICATIONS  


Negar Reiskarimian  
X-Window Consortium Career Development Assistant Professor  
Department of Electrical Engineering & Computer Science

Integrated circuits and systems and applied electromagnetics with a focus on analog, RF, millimeter-Wave (mm-Wave) and optical integrated circuits, metamaterials and systems for a variety of applications.

Rm. 39-427A | 617-253-0726 | negarr@mit.edu

GRADUATE STUDENT  
Soroush Araei, EECS

UNDERGRADUATE STUDENT  
Jose Guajardo, EECS

SUPPORT STAFF  
Jami Mitchell, Administrative Assistant

SELECTED PUBLICATIONS

A. Nagulu, N. Reiskarimian, and H. Krishnaswamy,  
"Non-reciprocal Electronics Based on Temporal Modulation,"  
*Nature Electronics*, pp. 1-10, May 2020

N. Reiskarimian, M. Khorshidian, and H. Krishnaswamy,  
"Inductorless, Widely-Tunable N-Path Shekel Circulators Based on Harmonic Engineering," accepted and to appear in  

M. Khorshidian, N. Reiskarimian, and H. Krishnaswamy,  
"A Compact Reconfigurable N-Path Low-Pass Filter Based on Negative Trans-Resistance with <1dB Loss and >21dB Out-of-Band Rejection," accepted and to appear in  

M. Khorshidian, N. Reiskarimian, and H. Krishnaswamy,  
"High-Performance Isolators and Notch Filters Based on N-Path Negative Trans-Resistance," in  

M. Baraani Dastjerdi, S. Jain, N. Reiskarimian, A. Natarajan, and H. Krishnaswamy,  
"Analysis and Design of Commutation-Based Circulator-Receiver for Integrated Full-Duplex Wireless," in  

N. Reiskarimian, M. Baraani Dastjerdi, J. Zhou, and H. Krishnaswamy,  
"Analysis and Design of Commutation-Based Circulator-Receiver for Integrated Full-Duplex Wireless," in  

N. Reiskarimian, A. Nagulu, T. Dinc, and H. Krishnaswamy,  
"Spatio-Temporal Conductivity Modulation: A Pathway Towards CMOS Compatible, Low Loss, Magnetic-Free Non-Reciprocity," in  

N. Reiskarimian, T. Dinc, J. Zhou, T. Chen, M. Baraani Dastjerdi, J. Diakonikolas, G. Zussman, and H. Krishnaswamy,  

N. Reiskarimian, T. Dinc, A. Nagulu and H. Krishnaswamy,  
"Integrated Conductivity-Modulation-Based RF Magnetic-Free Non-Reciprocal Components: Recent Results and Benchmarking," in  

M. Baraani Dastjerdi, N. Reiskarimian, T. Chen, G. Zussman, and H. Krishnaswamy,  
"Full Duplex Phased-Array Receiver Employing Self-Interference Cancellation via Beamforming," in  
Jennifer L. M. Rupp  
Professor of Electrochemical Materials  
Department of Materials Science and Engineering  
Department of Electrical Engineering and Computer Science

POSTDOCTORAL ASSOCIATES
Moran Balaiash, DMSE  
Juan Carlos Gonzalez Rosillo, DMSE  
Zachary Hood, DMSE  
Kunjoong Kim, DMSE  
Haemin Paik, DMSE  
Katarzyna Sokol, DMSE  
Linpeng Kong, DMSE

GRADUATE STUDENTS
Thomas Defferriere, DMSE  
Willis O’Leary, DMSE  
Sara Catherine Sand, DMSE  
Philipp Simons, DMSE  
Yuntong Zhu, DMSE  
Hyunwon Chu, DMSE  
Jesse Hinricher, DMSE

VISITORS
Wonseok Chang, MRL  
Lincoln Miara, DMSE  
Hyun Suk, DMSE  
Masaki Wadaguchi, MRL  
Eric Wang  
Heung Chan Lee, MRL

VISITING STUDENTS
Lorenz Olbrich  
Andrea Pertoldi  
Steven Schenk  
Eva Sediva, Swiss Federal Institute of Technology

SELECTED PUBLICATIONS


Max M. Shulaker
Assistant Professor
Emanuel E. Landsman Career Development Chair
Department of Electrical Engineering and Computer Science

POSTDOCTORAL ASSOCIATE
Gage Hills, MTL

GRADUATE STUDENTS
Aya Amer, EECS
Mindy Bishop, HST
Minghan Chao, EECS
Rebecca Ho, EECS
Pritpal Kanhay, EECS
Christian Lau, EECS
Tathagata Srimani, EECS
Andrew Yu, EECS

SUPPORT STAFF
Joanna Macliver, Administrative Assistant

SELECTED PUBLICATIONS


Charles G. Sodini  
LeBel Professor  
Department of Electrical Engineering & Computer Science

Electronics and integrated circuit design and technology. Specifically, his research involves technology intensive integrated circuit and systems design, with application toward medical electronic devices for personal monitoring of clinically relevant physiological signals.

Rm. 39-527b | 617-253-4938 | sodini @ mtl . mit . edu

COLLABORATORS
Sam Fuller, Analog Devices, Inc  
Thomas O’Dwyer, MTL Research Affiliate  
Joohyun Seo, Analog Devices, Inc.

POSTDOCTORAL STUDENT
Anand Chandraksekhar, MTL

SUPPORT STAFF
Kathleen Brody, Administrative Assistant

SELECTED PUBLICATIONS


Vivienne Sze
Associate Professor of Electrical Engineering & Computer Science
Department of Electrical Engineering & Computer Science

Joint design of signal processing algorithms, architectures, VLSI and systems for energy-efficient implementations. Applications include computer vision, machine learning, autonomous navigation, image processing and video coding.

Rm. 38-260 | 617-324-7352 | sze @ mit . edu

Vivienne Sze
Associate Professor of Electrical Engineering & Computer Science
Department of Electrical Engineering & Computer Science

Joint design of signal processing algorithms, architectures, VLSI and systems for energy-efficient implementations. Applications include computer vision, machine learning, autonomous navigation, image processing and video coding.

Rm. 38-260 | 617-324-7352 | sze @ mit . edu

GRADUATE STUDENTS
Hsin-Yu Lai, EECS (co-advised with T. Heldt)
Yi-Lun Liao, EECS,
Peter Li, EECS, Department Fellowship (co-advised with S. Karaman)
James Noraky, EECS
Gladynel Saavedra Pena, EECS (co-advised with T. Heldt)
Soumya Sudhakar, AeroAstro (co-advised with S. Karaman)
Yannan Nellie Wu, EECS (co-advised with J. Emer)
Tien-Ju Yang, EECS

UNDERGRADUATE STUDENTS
Alan Cheng, EECS
Keshav Gupta, EECS
Theia Henderson, EECS
Robert Law, EECS
Matthew Woicik, EECS
Diana Wofk, EECS

SUPPORT STAFF
Janice L. Balzer, Administrative Assistant

SELECTED PUBLICATIONS


*authors contributed equally
Carl V. Thompson  
Stavros Salapatas Professor of Materials Science and Engineering  
Department of Materials Science & Engineering  
Director of Materials Research Laboratory

Processing and property optimization of thin films and nanostructures for applications in electronic, microelectromechanical, and electrochemical devices and systems. Interconnect and device reliability.

Rm. 13-2098 | 617-253-7652 | cthomp @ mit. edu

RESEARCH SCIENTIST
Wardhana Sasangka, SMART

POSTDOCTORAL ASSOCIATES
Michael Chon, MRL  
Pushpendra Kumar, SMART  
An Tao, SMART  
Baoming Wang, MRL  
Xinghui Wang, SMART

GRADUATE STUDENTS
Michael Dubrovsky, ASP  
Maxwell L’Etoile, DMSE  
Jinghui, Miao, DMSE  
Yoon Ah Shin, DMSE  
Lin Xu, DMSE  
Gao Yu, NTU

UNDERGRADUATE STUDENT
Brian A. Mills, Physics

VISITORS
Daniel Nezich, Lincoln Laboratory  
Daniele Perego, Paul Scherer Institute, SMART  
Mark Polking, Lincoln Laboratory  
Annie Weathers, Lincoln Laboratory

SUPPORT STAFF
Sarah Ciriello, Administrative Assistant

SELECTED PUBLICATIONS

**Krystyn J. Van Vliet**  
Associate Provost  
Michael (1949) and Sonja Koerner Professor of Materials Science and Engineering  
Department of Materials Science and Engineering  
Department of Biological Engineering

---

**RESEARCH SCIENTIST**  
Anna Jagielska, BE

**GRADUATE STUDENTS**  
Yen-Ting Chi, DMSE  
Cammie Farrugio, DMSE  
Daniela Espinosa-Hoyos, ChemE  
Alex Mijailovic, MechE  
Mingyu Yang, HST

**GRADUATE STUDENTS**  
Michael Dubrovsky, ASP  
Maxwell L’Etoile, DMSE  
Jinghui, Miao, DMSE  
Yoon Ah Shin, DMSE  
Lin Xu, DMSE  
Gao Yu, NTU

**SUPPORT STAFF**  
Kathryn E. Simmons, Administrative Assistant

---

**SELECTED PUBLICATIONS**


---

**Material chemomechanics through both experiments and simulations among three main efforts: Chemomechanics at the cell-material interface, Chemomechanics of complex gels, and Chemomechanics of defected crystals and nanocomposite interfaces.**

**Rm. 8-237 | 617-253-3315 | krystyn @ mit . edu**
Luis Fernando Velásquez-García
Principal Research Scientist
Microsystems Technology Laboratories

**Micro- and nano-enabled multiplexed scaled-down systems that exploit high electric field phenomena; powerMEMS; additively manufactured MEMS/NEMS. Actuators, cold cathodes, ionizers, microfluidics, microplasmas, nanosatellite propulsion, portable mass spectrometry, pumps, sensors, X-ray sources.**

Rm. 39-415B | 617-253-0730 | lfvelasq@mit.edu

---

**GRADUATE STUDENTS**
Ashley L. Beckwith, MechE
Yosef S. Kornbluth, MechE
Zhumei Sun, MechE

**UNDERGRADUATE STUDENTS**
Sharon Lin, EECS
Zachary Pitcher, EECS
Maisha Prome, BioEng
Jordan Street, Wellesley

**VISITORS**
Javier Izquierdo Reyes, Tecnológico de Monterrey
Dulce Viridiana Melo Máximo, Tecnológico de Monterrey
Emmanuel Segura Cárdenas, Tecnológico de Monterrey
Anthony Taylor, Edwards Vacuum

**SUPPORT STAFF**
Jami L. Mitchell, Administrative Assistant

**SELECTED PUBLICATIONS**


Joel Voldman
Professor of Electrical Engineering
Faculty Head, Electrical Engineering
Department of Electrical Engineering & Computer Science

Microtechnology for basic cell biology, applied cell biology, Immunology, and human health.
Rm. 36-824 | 617-253-2094 | voldman @ mit.edu

POSTDOCTORAL ASSOCIATES
Bill Chow, RLE
Dohyun Lee, RLE
Sarvesh Varma, RLE

GRADUATE STUDENTS
Nicha Apichitsopa, EECS
Kru Kikkeri, EECS
Wei Liao, EECS
Dousabel May Yi Tay, ChemE
Dan Wu, MechE

VISITING POSTDOCTORAL ASSOCIATE
Mahdi Aeinehvand, Tec de Monterrey

SUPPORT STAFF
Chadwick Collins, Administrative Assistant

SELECTED PUBLICATIONS


Evelyn N. Wang
Department Head, Gail E. Kendall Professor
Department of Mechanical Engineering

Heat and mass transport at the micro- and nano-scales, nanoengineered surfaces, and thermal microdevices for applications in thermal management, solar thermal energy conversion, and water desalination.
Rm. 3-174 | 617-253-3523 | enwang @ mit . edu

POSTDOCTORAL ASSOCIATES
Shuai Gong, MechE
Xiangyu Li, MechE
Kyle Wilke, MechE

GRADUATE STUDENTS
Samuel Cruz, MechE
Carlos Daniel Diaz Marin, MechE
Cody Jacobucci, MechE
Arny Leroy, MechE
Jay Sircar, MechE
Youngsup Song, MechE
Geoffrey Vaartstra, MechE
Chad Wilson, MechE
Lenan Zhang, MechE
Yajing Zhao, MechE
Yang Zhong, MechE

UNDERGRADUATE STUDENT
John Adeyeye, MechE

SUPPORT STAFF
Alexandra Cabral, Administrative Assistant

SELECTED PUBLICATIONS


Bilge Yildiz
Professor
Department of Nuclear Science and Engineering
Department of Materials Science and Engineering

POSTDOCTORAL ASSOCIATES
Georgios Dimitrakopoulos, NSE
Nicolas Emond, DMSE
Franziska Hess, NSE
Jiwon Kim, NSE
Konstantin Klyukin, DMSE
Kevin May, DMSE
Anisur Rahman, NSE
Cigdem Toparli, NSE
Xiahui Yao, NSE
Pjotrs Zguns, DMSE

GRADUATE STUDENTS
Hiujun Chen, DMSE
Yen-Ting Chi, DMSE
Minh A Dinh, NSE
Dongha Kim, DMSE
Seungchan Ryu, MechE
Sara Sand, DMSE
Vrindaa Somjit, DMSE
Jiayue Wang, NSE
Hantao Zhang, NSE
William (Yu Ren) Zhou, DMSE

SUPPORT STAFF
Nancy Iappini, Administrative Assistant

SELECTED PUBLICATIONS


POSTDOCTORAL ASSOCIATES

GRADUATE STUDENTS

SUPPORT STAFF

SELECTED PUBLICATIONS

High-efficiency devices for energy conversion and information processing, based on solid state ionic-electronic materials. Design of novel surface/interface chemistries for efficient & durable solid oxide fuel cells, thermo/electro-chemical splitting of water & CO2, high energy density & high power density solid state batteries, redox based memristive information storage and logic, & corrosion resistant films in a wide range of extreme environments.

Rm. 24-210 | 617-324 4009 | byildiz @ mit . edu
Theses Awarded
Theses Awarded

S.B.

- **Brian A. Mills** (C. Thompson)
  Stress Evolution of RuO₂ Li-ion Thin Film Battery Electrodes (Tentative)

S.M.

- **Aya Amer** (A. Chandrakasan)
  SHARC: Self-healing Analog with RRAM and CNFETs
- **Kwabena Arthur** (G. Barbastathis)
  On the Use of Prior Knowledge in Deep Learning Algorithms
- **Alex Barksdale** (J. Han)
  Lithium Extraction from Brines Using Ion Concentration Polarization
- **Alan Casallas** (J. Lang)
  Contactless Voltage and Current Estimation Using Signal Processing and Machine Learning
- **Jeffery Bowen Chu** (N. Fang)
  Investigating the Feasibility and Impact of Integrating Wire-arc Additive Manufacturing in Aerospace Tooling Applications
- **Huifeng Du** (N. Fang)
  Finite Element Analysis of Adhesive Contact Interface in Continuous 3D Printing
- **Mingye Gao** (V. Bulović)
  Application of Graphene in Designing Tunneling Nanoelectromechanical Switches
- **Justin Hou** (L. Liu)
  Strong Coupling between Microwave Photons and Nanomagnets
- **Muhammad I. Ibrahim** (R. Han)
  Chip-scale Ambient Quantum Magnetometry via CMOS Integration with Diamond Color Centers
- **Iksung Kang** (G. Barbastathis)
  High-Fidelity Inversion at Low-photon Counts Using Deep Learning and Random Phase Modulation
- **Muhammad I. Khan** (R. Han)
  THzID: A 1.6mm2 Package-less Identification Tag with Backscattering and Beam-steering at 260GHz
- **Peter Li** (V. Sze)
  High-throughput Computation of Shannon Mutual Information on Chip
- **Yujun Lin** (S. Han)
  Mixed-precision NN Accelerator with Neural-hardware Architecture Search
- **Zhijian Liu** (S. Han)
  Hardware-efficient Deep Learning for 3D Point Cloud
- **Saurav Maji** (A. Chandrakasan)
  Energy-efficient protocol and hardware for security of implantable devices
- **Alberto Nardi** (K. Berggren)
  Novel Field Emission Devices for Vacuum Nanoelectronics and Optoelectronic Applications
- **Nicolo Petrini** (K. Berggren)
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## Glossary

### Technical Acronyms

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<tr>
<th>Acronym</th>
<th>Description</th>
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<tbody>
<tr>
<td>ADC</td>
<td>Analog-to-Digital Converters</td>
</tr>
<tr>
<td>CMOS</td>
<td>Complementary Metal–Oxide–Semiconductor</td>
</tr>
<tr>
<td>CNT</td>
<td>Carbon Nanotubes</td>
</tr>
<tr>
<td>ECP</td>
<td>Electro-chemical Plating</td>
</tr>
<tr>
<td>FET</td>
<td>Field-effect Transistor</td>
</tr>
<tr>
<td>HSQ</td>
<td>Hydrogen Silsesquioxane</td>
</tr>
<tr>
<td>InFO</td>
<td>Integrated Fan Out</td>
</tr>
<tr>
<td>MOSFET</td>
<td>Metal–Oxide–Semiconductor Field-effect Transistor</td>
</tr>
<tr>
<td>nTRON</td>
<td>Nanocryotron</td>
</tr>
<tr>
<td>RDL</td>
<td>Re-distribution Layers</td>
</tr>
<tr>
<td>RIE</td>
<td>Reactive ion etching</td>
</tr>
<tr>
<td>SNSPDs</td>
<td>Superconducting nanowire single photon detectors</td>
</tr>
<tr>
<td>SS</td>
<td>Subthreshold swing</td>
</tr>
<tr>
<td>TMAH</td>
<td>Tetramethylammonium Hydroxide</td>
</tr>
<tr>
<td>TREC</td>
<td>Thermally regenerative electrochemical cycle</td>
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### MIT Acronyms & Shorthand

<table>
<thead>
<tr>
<th>Acronym</th>
<th>Description</th>
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<tbody>
<tr>
<td>BE</td>
<td>Department of Biological Engineering</td>
</tr>
<tr>
<td>Biology</td>
<td>Department of Biology</td>
</tr>
<tr>
<td>ChemE</td>
<td>Department of Chemical Engineering</td>
</tr>
<tr>
<td>CICS</td>
<td>Center for Integrated Circuits and Systems</td>
</tr>
<tr>
<td>CMSE</td>
<td>Center for Materials Science and Engineering</td>
</tr>
<tr>
<td>IRG</td>
<td>Interdisciplinary Research Group</td>
</tr>
<tr>
<td>DMSE</td>
<td>Department of Materials Science &amp; Engineering</td>
</tr>
<tr>
<td>EECS</td>
<td>Department of Electrical Engineering &amp; Computer Science</td>
</tr>
<tr>
<td>ISN</td>
<td>Institute for Soldier Nanotechnologies</td>
</tr>
<tr>
<td>KI</td>
<td>David H. Koch Institute for Integrative Cancer Research</td>
</tr>
<tr>
<td>LL</td>
<td>Lincoln Laboratory</td>
</tr>
<tr>
<td>MAS</td>
<td>Program in Media Arts &amp; Sciences</td>
</tr>
<tr>
<td>MechE</td>
<td>Department of Mechanical Engineering</td>
</tr>
<tr>
<td>MEDRC</td>
<td>Medical Electronic Device Realization Center</td>
</tr>
<tr>
<td>MIT-CG</td>
<td>MIT/MTL Center for Graphene Devices and 2D Systems</td>
</tr>
<tr>
<td>MITEI</td>
<td>MIT Energy Initiative</td>
</tr>
<tr>
<td>MIT-GaN</td>
<td>MIT/MTL Gallium Nitride (GaN) Energy Initiative</td>
</tr>
</tbody>
</table>
MISTI  MIT International Science and Technology Initiatives
MIT-SUTD  MIT-Singapore University of Technology and Design Collaboration Office
MIT Skoltech  MIT Skoltech Initiative
MTL  Microsystems Technology Laboratories
NSE  Department of Nuclear Science & Engineering
Physics  Department of Physics
Sloan  Sloan School of Management
SMA  Singapore-MIT Alliance
† SMART  Singapore-MIT Alliance for Research and Technology Center
† SMART-LEES  SMART Low Energy Electronic Systems Center
SUTD-MIT  MIT-Singapore University of Technology and Design Collaboration Office
UROP  Undergraduate Research Opportunities Program

U.S. GOVERNMENT ACRONYMS

AFOSR  U.S. Air Force Office of Scientific Research
† FATE-MURI  Foldable and Adaptive Two-dimensional Electronics Multidisciplinary Research Program of the University Research Initiative
AFRL  U.S. Air Force Research Laboratory
ARL  U.S. Army Research Laboratory
† ARL-CDS  U.S. Army Research Laboratory Center for Distributed Quantum Information
ARO  Army Research Office
ARPA-E  Advanced Research Projects Agency - Energy (DOE)
DARPA  Defense Advanced Research Projects Agency
† DREA  Dynamic Range-enhanced Electronics and Materials
DoD  Department of Defense
DoE  Department of Energy
† EFRC  U.S. Department of Energy: Energy Frontier Research Center (Center for Excitonics)
DTRA  U.S. DoD Defense Threat Reduction Agency
IARPA  Intelligence Advanced Research Projects Activity
† RAVEN  Rapid Analysis of Various Emerging Nanoelectronics
NASA  National Aeronautics and Space Administration
† GSRP  NASA Graduate Student Researchers Project
NDSEG  National Defense Science and Engineering Graduate Fellowship
NIH  National Institutes of Health
† NCI  National Cancer Institute
NNSA  National Nuclear Security Administration
NRO      National Reconnaissance Office
NSF      National Science Foundation
CBMM     NSF Center for Brains, Minds, and Machines
CIQM     Center for Integrated Quantum Materials
CSNE     NSF Center for Sensorimotor Neural Engineering
E3S      NSF Center for Energy Efficient Electronics Science
GRFP     Graduate Research Fellowship Program
IGERT    NSF The Integrative Graduate Education and Research Traineeship
NEEDS    NSF Nano-engineered Electronic Device Simulation Node
SEES     NSF Science, Engineering, and Education for Sustainability
STC      NSF Science-Technology Center
ONR      Office of Naval Research
PECASE   Presidential Early Career Awards for Scientists and Engineers

OTHER ACRONYMS

CNRS Paris Centre National de la Recherche Scientifique
CONACyT Consejo Nacional de Ciencia y Tecnología (Mexico)
IEEE Institute of Electrical and Electronics Engineers
IHP Germany Innovations for High Performance Microelectronics Germany
KIST Korea Institute of Science and Technology
KFAS Kuwait Foundation for the Advancement of Sciences
MASDAR Masdar Institute of Science and Technology
NTU Nanyang Technological University
NUS National University of Singapore
NYSCF The New York Stem Cell Foundation
SRC Semiconductor Research Corporation
NEEDS NSF/SRC Nano-Engineered Electronic Device Simulation Node
SUTD Singapore University of Technology and Design
TEPCO Tokyo Electric Power Company
TSMC Taiwan Semiconductor Manufacturing Company
IN APPRECIATION OF OUR
MICROSYSTEMS INDUSTRIAL GROUP
MEMBER COMPANIES:

Analog Devices, Inc.  IBM
Applied Materials  Lam Research Co.
Draper  NEC
Edwards  TSMC
HARTING  Texas Instruments
Hitachi High-Tech Corporation

AND MIT.NANO CONSORTIUM MEMBER COMPANIES:

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Analog Devices, Inc.  Lam Research
Dow  NCSOFT
Draper  NEC
DSM  Raith
Edwards  Waters
Fujikura