

# Ming Hsieh Department of Electrical and Computer Engineering

**USC**Viterbi

School of Engineering

# Making Ideas Work in the Real World

Richard Leahy, ECE Chair - Systems (leahy@usc.edu)

Tony Levi, ECE Chair - Electrophysics (alevi@usc.edu)



- Founded in 1880. The oldest private research university in California
- Second largest private university in USA with more than 47,000 students
- University budget (2017-2018) \$4.9B
- University endowment (2017) \$5.1B
- Sponsored research (2017) \$0.7B+
- Ranked 15<sup>th</sup> in USA by *Wall Street Journal* & *Times Higher Education*
- Distinguished faculty (more than 4,300 faculty)
  - 6 Nobel laureates and 1 Turing Award winner
  - 10 National Medal Winners
  - 14 National Academy of Sciences members
  - 32 National Academy of Engineering members
  - 17 Institute of Medicine members
  - 4 National Academy of Education members
- Notable alumni (375,000+ living)
  - Neil Armstrong, George Lucas, Frank Gehry, Andrew Viterbi, Shinzō Abe
  - Alumni founded companies include Qualcomm, Lucasfilm, Salesforce.com, Vizio, Intuit, Box, Tinder, Myspace, Riot Games, Oakley, Kinko's, CPK, ...
  - USC Olympians have taken 135 gold medals, 88 silver, and 65 bronze medals





# Viterbi School of Engineering

- Ranked 10<sup>th</sup> in USA by U.S. News and World Report
- \$204M+ annual research expenditure
- ECE: Electrical and Computer Engineering
- CS: Computer Science
- ISI: Information Science Institute
- Related University centers
  - ICT: Institute for Creative Technology
  - HPCC: High Performance Computing Center





# Ming Hsieh Department of Electrical and Computer Engineering

- Founded in 1905
- 300 undergraduate students, 1400+ M.S. students, 300 Ph.D. students
- Research volume (2017) \$35M+
- Ranked 13<sup>th</sup> in USA by U.S. News and World Report
- 66T/TT full-time faculty
- Notable alumni
  - Andrew Viterbi, Ph.D. in 1963, Co-founder of Qualcomm
  - Ming Hsieh, B.S. in 1983, M.S. in 1984, Founder & CEO of Cogent Systems Inc.
  - William Wang, B.S. in 1986, Founder & CEO of Vizio
  - Mike Markkula, B.S. and M.S., Angel Investor & second CEO of Apple
  - Kevin Jou, Ph.D., CTO of MediaTek
  - Xiaofan Simon Cao, M.S. & Ph.D., CEO of Materion Precision Optics (Shanghai)



# Department organization and research areas

## **Electrophysics**

#### **Photonics and electromagnetics**

Nanophotonics, lasers, silicon photonics integrated circuits, mid-infrared sensing, microphotonics, metamaterials, and imaging. Pulsed power and transient plasmas, radar and RF imaging

#### Nano- and micro-technologies

Emerging nanomaterials for electronics and photonics applications, memory device technology and applications, carbon electronics, two-dimensional electronic materials, lithium ion batteries, biosensors, non-equilibrium electrochemistry, photocatalysis, acoustic and ultra-sound MEMS

#### Analog and mixed-signal circuits

Radiofrequency and millimeter-wave integrated circuits, data converters (ADC, DAC), clock generation (PLL), wireless/wireline communication circuits, low-power AI/ML computing circuitry, automated mixed-signal circuit design methodology. Low-power biomedical devices for personalized healthcare and neural interfaces

# Systems

#### Signals and image processing

Human speech and audio signal processing, biomedical imaging and signal processing, theory and algorithms, machine learning, video, and graph applications

#### **Communications and networks**

Cognitive radio, wireless propagation channels, security, network optimization, protocols, modeling, network control, undersea systems, optical communication systems, information theory, coding, quantum information processing.

#### Control

Network and complex system control, quantum and cyber-physical control

#### **Computer engineering**

VLSI/CAD methodology, data centers, cloud computing, big data, parallel and distributed processing, FPGAs, GPUs, resilience, computer architectures, network control and optimization, asynchronous circuits, design for cyber physical systems and IoT, yield and testing



#### Photonics and electromagnetics

Nanophotonics, lasers, silicon photonics integrated circuits, mid-infrared sensing, microphotonics, metamaterials, and imaging. Pulsed power and transient plasmas, radar and RF imaging

#### Nano- and micro-technologies

Emerging nanomaterials for electronics and photonics applications, memory device technology and applications, carbon electronics, two-dimensional electronic materials, lithium ion batteries, biosensors, non-equilibrium electrochemistry, photocatalysis, acoustic and ultra-sound MEMS

#### Analog and mixed-signal circuits

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# **Photonics and electromagnetics**



# **Photonics**

- Nanophotonic thermal memories and logic ٠
  - Nanophotonic resonant structures with laser read, write, erase and data stored in temperature
- Han Wang



- **Optomechanics and Nanophotonics** •
  - Fundamentals of light propagation in nanostructured materials for applications in optical communications, energy, and biology
  - Optical trapping, nano-particle manipulation, and size sorting
  - Arbitrary infrared emission spectra and radiation profiles using microstructure
  - **Tunable NIR FPA**
  - Resonant optical structures integrated with 2D black phosphorous detection
  - Silicon integrated photonics and CMOS ٠
    - LIDAR beam-steering > +/- 22 deg









🔳 Si

**Thermal Memories** and Thermal Logic



Dapkus

P. Dan





Hossein Hashemi



# **Electromagnetics and plasma engineering**

- Remote sensing with electromagnetic waves ٠
  - Forward scattering models and the inverse problem
  - Polarimetric Synthetic Aperture Radar (SAR), P-band (420 440 MHz)
- Compact high-performance antennas ٠
  - Ultra wideband array antennas
- Pulsed power •
  - Ion propulsion, electron beams, x-ray sources •
  - Cancer therapies with ultrashort intense pulsed electric fields •
- Applied plasma devices and systems ٠
  - Transient plasma ignition for improved combustion and fuel efficiency
  - Cold plasma for root canal disinfection •

Steve Cronin

Martin











Transient Plasma Ignition: (a,b) End, side views of transient plasma. (c) streamer and arc in combustion chamber.

Mahta Moghaddam

AirMOSS

CALM sites UAF GIPL sites

Council

(ABoVE)

NASA Arctic-Boreal

**Vulnerability Experiment** 

Aluizio Prata





#### **3-D Computing Systems: Materials and Devices**





**High-capacity porous** silicon anode for lithium ion batteries



# Nano- and micro-technologies



Active matrix OLED display with nanotube transistors: Technology transfer to **Carbonics Inc.** 

**Circuits based on aligned** carbon nanotubes





Memristive devices for neuromorphic computing



Rotational manipulation of Zebrafish embryo (24 - 36 hourspost-fertilization) with acoustic tweezers

Prof. Rehan Kapadia









Prof. Hahn Wang



Prof. Tony Levi

Synapse 3

Dendrite

**Optimal device** design











- Carbon nanotubes, graphene, nanowires
  - Synthesis, properties and applications •
- Nanobiotechnology
  - Biosensors •
- Nanochemistry catalysis and spectroscopy
  - Hydrogen production, synthetic petroleum reducing CO emissions
- Energy nanotechnology
  - Super capacitors, lithium ion batteries
- Nano-electronics and nano-photonics
  - Optical negative index meta-material
- 2D material systems
  - Black phosphorus, graphene, hBN, metal dichalcogenides
  - 2D Material based plasmonics and metamaterials
- High-performance photonics and electronics on arbitrary substrates
  - Thin-film vapor-liquid-solid growth
- New format electronics
  - 3D integration and folding electronics
  - Bio-inspired/bio-integrated electronics
- III-V compounds on silicon
  - Growth of single crystal III-V's directly on Si •
  - III-V photonics and electronics on Si











**Biosensing InOx nanowire FET transistor** functionalized with antibody selective to SARS virus





3D integration of

unconventional

materials on traditional

silicon

RRAM **CNFET-layer** CMOS







receiver test-board



Digital Power Amplifier: 46 GHz, 29 dBm, 18%

Prof. Hossein



NUS ADC

Prof. Dina

El-Damak

# Analog and mixed-signal circuits



**Energy harvester** 

Prof. Manuel Monge





Fully Implantable Amperometric Biosensor



Machine learning for mixed-signal circuit design



# **Biomedical interface engineering**

#### Ultra-low power circuits and systems

Dina El-Damak



Low power SAR ADC for EEG SoC



- Circuit design with emerging technologies
- Power management, energy harvesting
- Biomedical devices for personalized healthcare



Armand R. Tanguay, Jr.



#### Gianluca Lazzi



**Director ITEMS** Neuro-interface engineering

13

200 µs

Eun Sok Kim



Piezo-electric nozzle-less droplet ejector







1100 μs



Manuel Monge

**Operated as Magnetic** Spins (ATOMS) with power, communication, location, integrated bio-sensing and actuation technologies

Addressable Transmitters



High-precision electronic medicine

# Scan Chain TIA

# Example research project: Automated Analog Mixed Signal (AMS) netlist generation ecosystem

- **Open-source** automated AMS IP schematic generation
- Leverage USC circuit designs in 180nm, 65nm and 14nm FinFET
- Architectures for advanced technology IP blocks that meet or exceed metrics:
  - PLL range: 10 MHz 10 GHz
  - DLL range: 10 MHz 10 GHz
  - ADC range: 1 10,000 MS/s
  - DAC range: 1 10,000 MS/s
- Machine learning (e.g., ANN) and optimization (e.g., convex) around knowngood design (KGD) points

#### Mike Chen

Tony Levi Sandeep Gupta





# Systems

#### Signals and Image Processing

Human speech and audio signal processing, biomedical imaging and signal processing, brain-computer interfaces, theory and algorithms, machine learning, video, computer vision and graph applications

#### **Communications and networks**

Cognitive radio, wireless propagation channels, security, network optimization, protocols, modeling, network control, undersea systems, optical communication systems, information theory, coding, quantum information processing.

#### Control

Network and complex system control, robust control, quantum and cyber-physical control, power distribution and financial networks, AI for autonomous vehicles.

#### **Computer engineering**

New computing paradigms (hardware and software), VLSI/CAD methodology, data centers, cloud computing, big data, parallel and distributed processing, FPGAs, GPUs, resilience, computer architectures, network control and optimization, asynchronous circuits, design for cyber physical systems and IoT, yield and testing

# Signals and image processing

- Signals
  - Traditional (speech, audio, images, video)
  - New datasets (MoCap, MRI, event traces, data in the wild)
  - Big data (social media, genomic, brain images)
- Theory and Algorithms
  - Signals and system: compressed sensing, wavelets, non-Gaussian modeling, stochastic resonance, close-looped control
  - Inference: fuzzy logic, machine learning

Prof. Mahdi

Soltanolkotabi

- Broad applications
  - Biomedical
  - Communications
  - Cybersecurity

Prof. Jay

Kuo

- Speech and audio
- Human behavior

Graphs, neural networks, optimization and big data – video, vision and other applications

Prof. Antonio

Ortega

centered signal processing

Prof. Bart

Kosko

Prof. Shri P Naryanan (

Speech, audio and human-

Prof. Panos Prof. Jus Georgiou Haldar

Prof. Justin Prof. Krishna Prof. Maryam Prof. Richard Haldar Nayak Shanechi Leahy

Biomedical imaging and signal processing



BrainSuite image analysis tools to process magnetic resonance images (MRI) of the human head



# Example research project: TILES tracking Individual performance with sensors study

- Researchers at the University of Southern California (USC), University of Washington, INRS-EMT/University of Quebec, and Evidation Health have partnered with The Intelligence Advanced Research Projects Activity (IARPA)
- The purpose of this study is to understand how individual differences, mental states, and well-being affect job performance
- Data collected from 250 Keck Medicine of USC nurses
- Project led by Professor Shri Narayanan





Prof. Shri Naryanan

- Multisensor tracking:
  - Personal: Fitbit Charge 2 (wrist), Omsignal (chest), Android Jelly (audio)
  - Environmental: ReelyActive Owl-in-one (temp, humidity, motion, etc), Minew Beacons (environmental factors)
  - Analysis using signal processing, graph analysis, machine learning to understand relationship between individual physiological and environmental factors in stressful work situations.

# Wireless and sensor networks Image: Sensor connected to custom radio node Base station Image: Sensor connected to custom radio node Image: Sensor custom radio node Image:

# **Communications and networks**

- Wireless and sensor networks (Krishnamachari, Psounis, Raghavendra)
- Algorithms and protocols for wireless networks (Krishnamachri)
- Network control, optimization and games (Jain)
- High performance computing networks (Silvester)
- Optical communications and networks (Willner)
- Information theory (Avestimehr, Mitra)
- Routing and Scheduling (Neely, Avestimehr, Molisch)
- Body area networks (Mitra, Molisch)
- MM-wave directional links (Willner, Molisch)
- Video networks (Molisch, Neely)
- MIMO systems, propagation channels, cognitive radio (Molisch, Mitra)
- Modulation and Coding (Chugg)
- Underwater systems (Mitra)
- Quantum Information Processing (Brun, Lidar, Reichardt)





Transportation networks (Ioannou)



Quantum adiabatic computations to solve network optimization subject to noise constraints (Jonckheere)

# Control



Power grid, network of dynamical distributed systems (Jonckheere, Ioannou, Jain, Jovanovic)

#### Robust, multivariable, nonlinear, big data driven adaptive control ٠ (Ioannou, Jonckheere, Jovanovic)

- Network control •
  - Transportation networks (loannou)
  - Power grid (Jonckheere, Jain) ٠
  - Stochastic networks and network economics (Jain) ٠
  - Congestion control (Jonckheere, Krishnamachari)
- Quantum and cyber-physical control (Jonckheere, Lidar, Bogdan) •
- Dynamics and control of distributed systems (Jovanovic) •
- Stochastic control and communications (Nayyar)
- Network market design and power system economics (Jain)



Prof. Edmond Jonckheere

Prof. Paul Prof. Petros Bogdan

Ioannou

Prof. Ashutosh Nayyar





Data Centers, Cloud Computing, Big Data

# **Computer engineering**

- Data centers, cloud computing, big data (Annavaram, Hwang, Prasanna)
- Tools and techniques for hardware resilience (Annavaram, Dubois)
- GPUs and GPGPUs (Annavaram)
- Parallel and distributed processing, FPGAs, GPUs, Accelerators (Prasanna)
- Cross-stack graph processing acceleration (Qian)
- Accelerating applications using emerging memory technology (Qian)
- CMP protocols and micro-architectures (Dubois)
- Cyber Physical Systems (CPS) (Bogdan)
- Methodologies and tools for the design of CPS and the Internet-of-Things (Nuzzo)
- BioRC biomimetic real-time cortex (Parker)
- Asynchronous circuits (Beerel)
- Energy-efficient information systems and CAD (Pedram)
- Yield and testing (Gupta)



# **Example research project: The AutoDRIVE Lab**

- Average human driving records ~200 crashes/100 injuries/1 fatality per 100M vehicle miles travelled (150x greater deaths vz. commercial airline miles flown)
- Current autonomous driving technology no match! Achieves ~1 disengagement per 2-5k miles
- Need new/different methods
- Formal Reinforcement Learning to learn from safe human driving demonstrations and yet satisfy formal safety specifications to match human driving performance
- autoDX: An Experimental testbed for a signalized traffic intersection with scaled vehicular models equipped with cameras, radar, ultrasonic sensors, GPS, etc. and a high-fidelity driving simulator



Prof. Pierluigi Nuzzo

Prof. Rahul Jain



Artificial Intelligence (AI) for Safe Autonomy



#### ColdFlux: CAD methodologies and tools for single-flux quantum-based superconductive electronics

Limit due to interconnect delay

GaAs

MESFE

Si MOSFET

Limit due to heat generation in CMOS

Limit due to heat

generation in

semiconductor

compound

Future SFO

Circuits

1012

10<sup>9</sup>

10<sup>6</sup>

- The ColdFlux project develops design flows, tools, and capabilities to empower VLSI design of Superconductive Electronics (SCE) as a step toward the realization and widespread deployment of ultra energy-efficient and high-performance superconductive computing fabrics
- The ColdFlux team is conducting research and developing Single Flux Quantum (SFQ) cell libraries with a comprehensive set of open-source EDA tools to enable compact modeling and simulation of devices and gates and VLSI design and verification of SFQ circuits at least from the RTL description down to mask layout



# Example research projects: New computing paradigms: Coded and Neuromorphic Computing



- What if some nodes are malicious?
- What if we want to keep data private?



NeuRoBot: quadruped robot with neuromorphic spinal cord

- The *NeuRoBot* with a nervous system is learning new tasks continuously, overlaid on existing analog electronic neurons modeling the cortex
- The *NeuRoBot* features neuromorphic implementations of biological systems
- Learning mechanisms have a biological basis, include synaptic, dendritic and structural connectivity and plasticity
- *NeuRoBots* are learning to perform locomotor tasks by exploiting plasticity and reward mechanisms (electronic dopamine) at the neural level
- We are imbuing a biomimetic quadruped robot with a neuromorphic spinal cord that implements reflexes and drives simulated muscles

Coded computing provides a framework for Resilient, Secure, and Privacy-Preserving distributed machine learning



Prof. Alice Parker



## The Center for Intelligent Biosensing, Imaging, Analysis and Control (CIBIAC)

- Example of group activity that may migrate to the Michelson Center for Convergent Bioscience (MCCB)
  - **5 key ECE faculty**: Maryam Shanechi, Justin Haldar, Krishna Nayak, Shri Naryanan and Richard Leahy
  - Active funding in which one of the 5 CIBIAC faculty is **PI** exceeds \$40M (~\$10M/yr)
  - Currently, 56 PhD students, 6 postdocs, and 2 research faculty
  - With recruitment of two new junior faculty, anticipate expansion to total of approximately 85 individuals
  - Unique **experimental facility** enabled by \$2.4M NSF instrumentation grant to develop a new whole-body high-performance low-field (0.5T) MRI scanner optimized for use in dynamic speech, sleep, cardiac, and musculoskeletal imaging studies, likely to be located in the basement of MCCB

Maryam Shanechi Justin Haldar Krishna Nayak Shri Naryanan Richard Leahy









Additional background material



# **Information Sciences Institute**

- Founded in 1972 and headquartered in Marina Del Rey
- \$100M+ annual budget
- Pioneering contributions to some important technologies
  - Foundational contributions to the Internet
  - Fundamental contributions to electronics and several areas of AI
  - Home of USC/Lockheed Martin Quantum Computing Center
- Broad research portfolio combines basic and applied research
  - AI/ML, Networking, Cybersecurity, Electronics, Quantum Computing, Medical Informatics, Scientific Workflows, Space technologies
  - History of open source software: Karma information integration tool (top 1% of GitHub downloads worldwide), Domain Insight Graphs



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School of Engineering

## **Computer Science**



- 1200 undergraduate students, 2000+ M.S. students, 300 Ph.D. students
- Ranked 11<sup>th</sup> in USA by U.S. News and World Report (2017)
- 45 T/TT full-time faculty
- Research areas:
  - Artificial Intelligence, Agents, Natural Language, Vision (total faculty: 25)
    - Computational Linguistics, Statistical Machine Learning Lab, Data Science Lab
  - Databases and Information Management (total faculty: 6)
    - Database Lab, Machine Learning and Data Mining Lab, Semantic Information Research
  - Graphics, Games & Multimedia (total faculty: 9)
    - Computer Graphics and Immersive Technologies, USC Gamepipe Laboratory
  - Parallel and Distributed Computation (total faculty: 4)
    - Collaboratory for Advanced Computing and Simulations (CACS), FPGA/Parallel Computing Group
  - Privacy & Security (total faculty: 3)
    - Center for Computer Systems Security, Privacy Research Lab, STEEL Security Research Lab
  - Robotics, Brain Theory, and Computational Neuroscience (total faculty: 10)
    - USC Brain Project, Interaction Lab, Polymorphic Robotics Lab, Computational Social Science Lab
  - Software Systems and Engineering (total faculty: 3)
    - US Center for Systems and Software Engineering (CSSE)
  - Systems, Distributed Systems, Communication Networks (total faculty: 7)
    - Quantitative Evaluation & Design Lab (QED), Autonomous Networks Research Group, Networked Systems Lab
  - Theory and Computational Sciences (total faculty: 10)
    - Collaboratory for Advanced Computing and Simulations (CACS), CS Theory Group