

RESEARCH ON TAP

Robotics and Autonomous Systems

Wednesday, February 8, 2023

bu.edu/research/events



Agenda

- Welcome Remarks
- Presentations
 - Yannis Paschalidis
 - Christos G. Cassandras
 - Calin Belta
 - Roberto Tron
 - Wenchao Li
 - Alyssa Pierson
 - Douglas P. Holmes
 - Lou Awad
 - Terry Ellis
 - Eshed Ohn-Bar
 - Sheila Russo
 - Tommaso Ranzani
 - Andrew Sabelhaus
 - Sean Andersson
- Closing Remarks



Bio-Inspired Robust Autonomy

Yannis Paschalidis

**Distinguished Professor of Engineering
(Electrical & Computer, Systems, and Biomedical)
Founding Professor of Computing & Data Sciences
Director, Hariri Institute**



Rafik B. Hariri Institute for Computing
and Computational Science & Engineering



BU Robotics & Autonomous Systems Teaching and Innovation Center (RASTIC)

Training the next workforce in RAS in partnership with industry

- Coming in the Fall of 2023 in the former CVS location on Comm. Ave.
- Supported by an \$8.8M grant (50-50 with BU) from



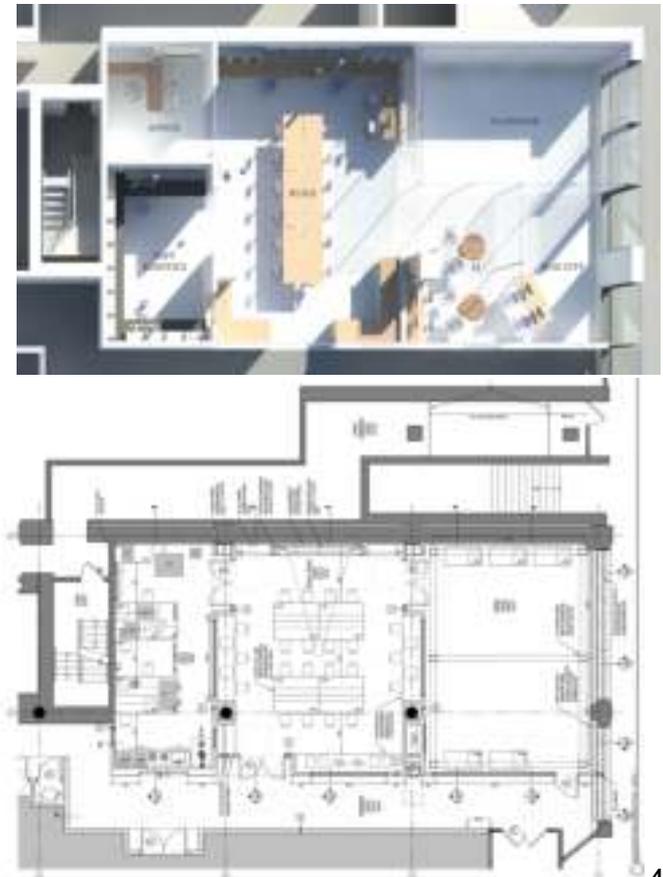
- with industry support



- to enable student projects and research at the M.S. level, but also undergrads & Ph.D.'s



Boston University Office of Research



(Full) Autonomy is Hard

Quiz:

- “My guess as to when we would think it is safe for somebody to essentially fall asleep and wake up at their destination: probably toward the end of next year. I would say I am certain of that. That is not a question mark.” **[2019]**
- “I thought the self-driving problem would be hard, but it was harder than I thought. It’s not like I thought it’d be easy. I thought it would be very hard. But it was actually way harder than even that.” **[2022]**
- **Who made both statements above?**



Mission-driven navigation in unstructured terrains is Harder

- **Self-driving cars:** Great sensors, well-mapped & structured terrain, few objects to recognize
- **Animals and humans do it => Understand the science of animal/human navigation**
- **Bio-inspired & Neuro-inspired:** Incorporate neuroscience-inspired understanding of how animals and humans navigate



\$7.5M ONR MURI



Bio-Inspired and Robust Autonomy

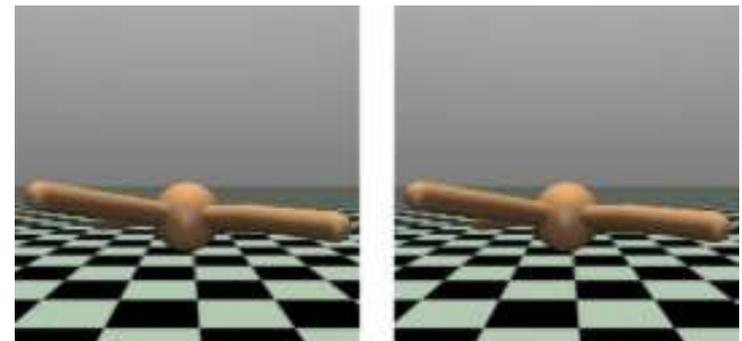
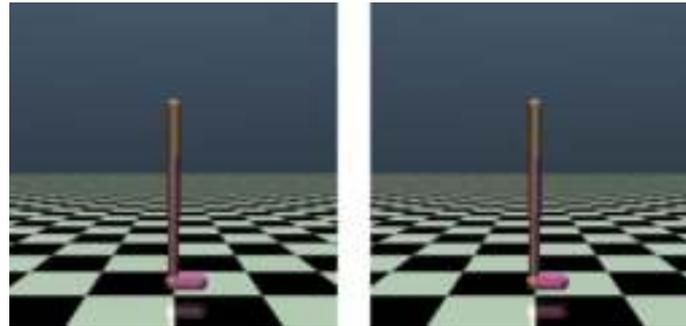


Methods to learn navigation policies from biological data:

- Learning a flat MDP policy (IEEE T. Autom. Control, 2019)
- Using moth data (PLOS Comp. Bio, 2020)
- Hierarchical Imitation Learning (AISTATS, 2021, IEEE CDC 2021)
- Achieving human-like performance using human data from a foraging game (with Stern & Hasselmo)

Robust and Sample-Efficient Reinforcement Learning:

- Robust policy optimization (AAAI 2021)
- Policy optimization with sample re-use (NeurIPS 2021)



Theory of Neural RL:

- Neural TD (ICLR 2023)



Network Optimization & Control Lab



Current students who contributed to this work: Jimmy Queeney, Zhiyu Zhang, Vittorio Giammarino, Nguyen Nguyen, Haoxing Tian, Arsenii Mustafin

Alumni: Dr. Henghui Zhu

Collaborators: Alex Olshevsky, Christos Cassandras, Mike Hasselmo, Chantal Stern, Sean Andersson (RASTIC)

Safe Autonomous Systems In Robotics And The Internet Of Vehicles

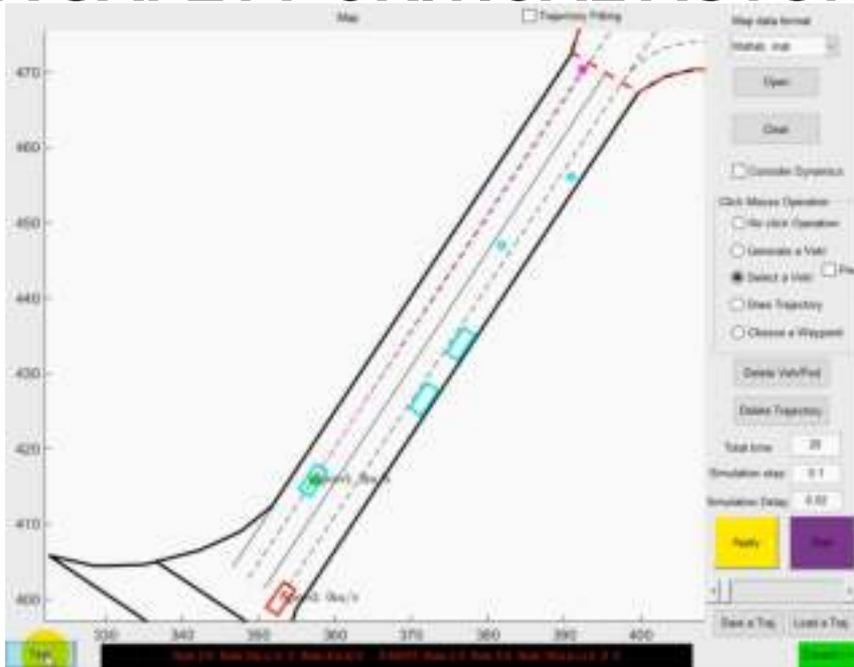
Christos G. Cassandras

<https://christosgcassandras.org/>

Distinguished Professor of Engineering
Head, Division of Systems Engineering
Professor of Electrical and Computer Engineering
Center for Information and Systems Engineering



A SAFETY-CRITICAL AUTONOMOUS SYSTEM

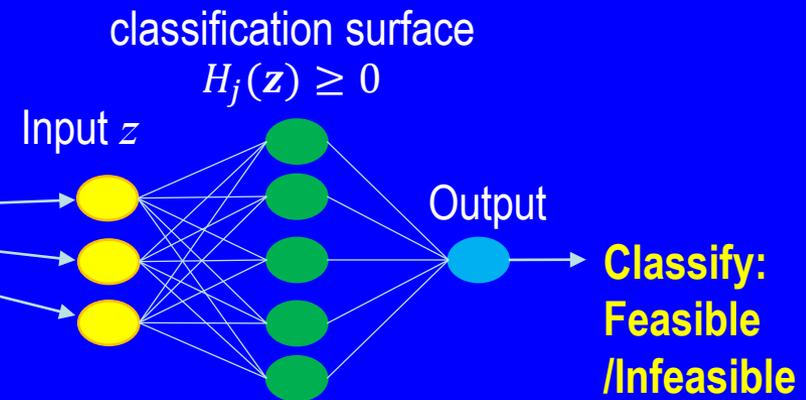
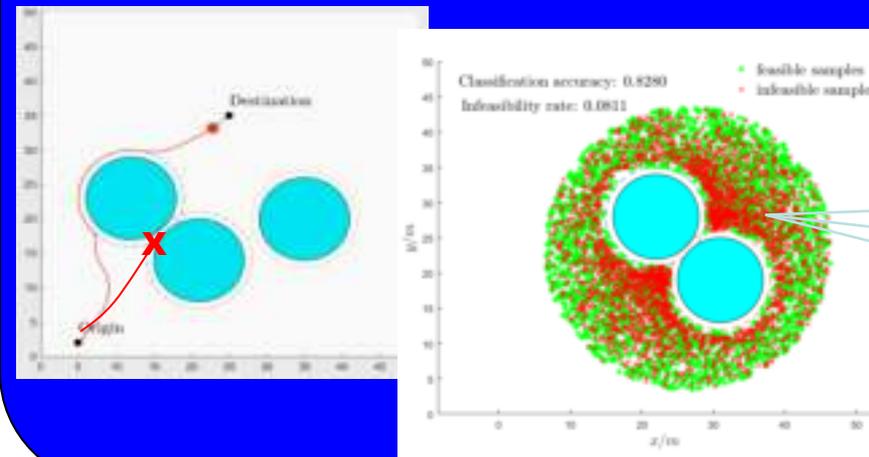


$$\underbrace{\begin{bmatrix} \dot{s} \\ \dot{\eta} \\ \dot{\mu} \\ \dot{v} \\ \dot{a} \\ \dot{\delta} \\ \dot{\omega} \end{bmatrix}}_{\dot{x}} = \underbrace{\begin{bmatrix} \frac{v \cos(\mu + \beta)}{1 - n\kappa} \\ v \sin(\mu + \beta) \\ \frac{v}{l_r} \sin \beta - \kappa \frac{v \cos(\mu + \beta)}{1 - n\kappa} \\ a \\ 0 \\ \omega \\ 0 \end{bmatrix}}_{f(x)} + \underbrace{\begin{bmatrix} 0 & 0 \\ 0 & 0 \\ 0 & 0 \\ 0 & 0 \\ 1 & 0 \\ 0 & 0 \\ 0 & 1 \end{bmatrix}}_{g(x)} \underbrace{\begin{bmatrix} u_{jerk} \\ u_{steer} \end{bmatrix}}_u$$

- Trajectory tracking (mid-lane)
- State constraints (steering angle, speed)
- Control bounds (jerk, steering accel.)
- Obey prioritized list of traffic rules

REAL-TIME LEARNING IN ROBOTICS

- Learn safe trajectories **on line** before being forced to stop or enter unsafe sets



WHY CAN'T WE IMPROVE TRAFFIC?

- **Not enough controls** → No chance to unleash the power of feedback!
- **Not knowing other drivers' behavior** → Drivers seek individual (**selfish**) optimum, not system-wide (**social**) optimum → **Price of Anarchy** (PoA)



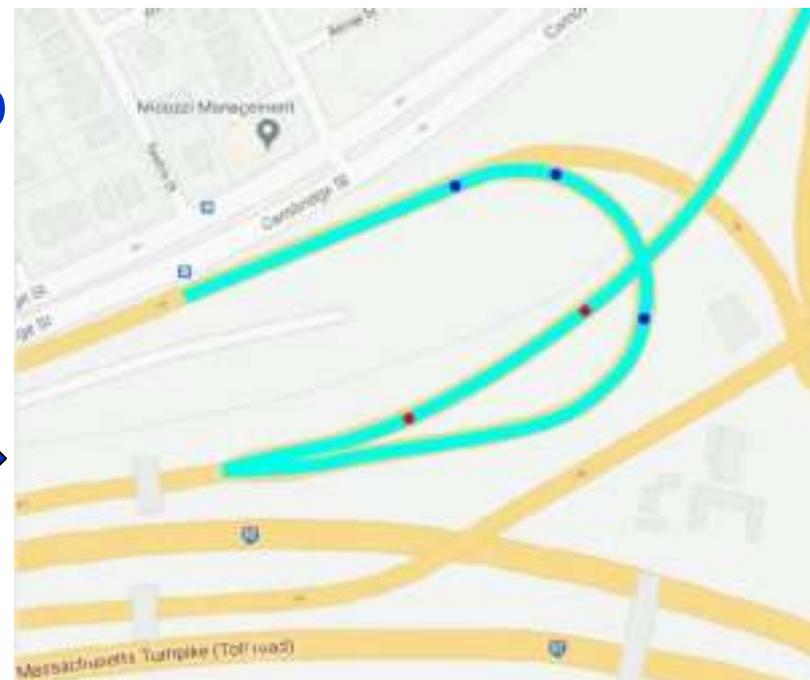
THE "INTERNET OF C



MERGING INTO
MASS PIKE

Now...

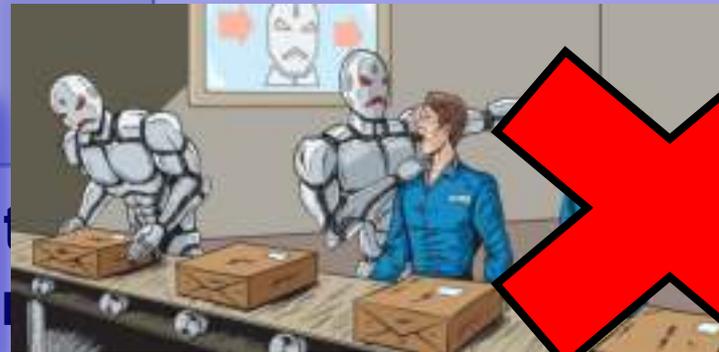
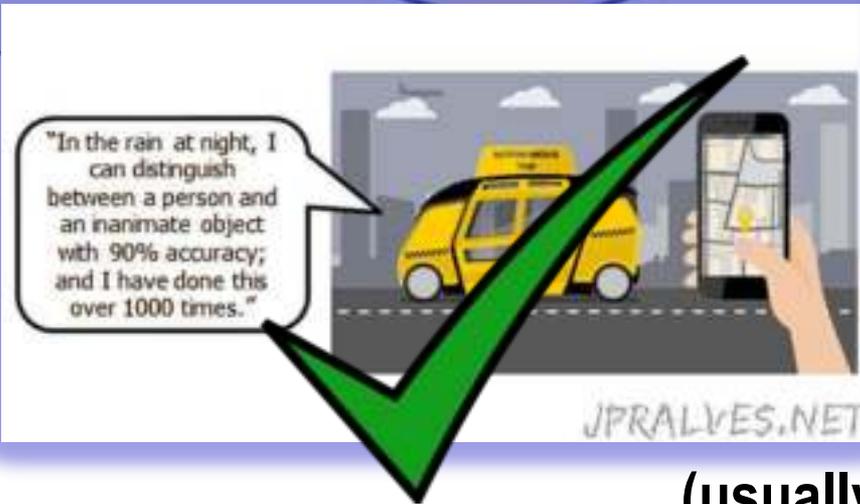
Autonomous
Vehicles



OPEN RESEARCH PROBLEMS



Design autonomous systems trading off:
 Conservativeness for **safety**
 v. Efficient **performance**
 v. Computational **Complexity**



LEARNING fit in?

between knowledge of system structure
 that we have no good models for
 (usually **human** behavior...)

Formal Methods for Autonomy

Calin Belta

Professor

Mechanical Engineering

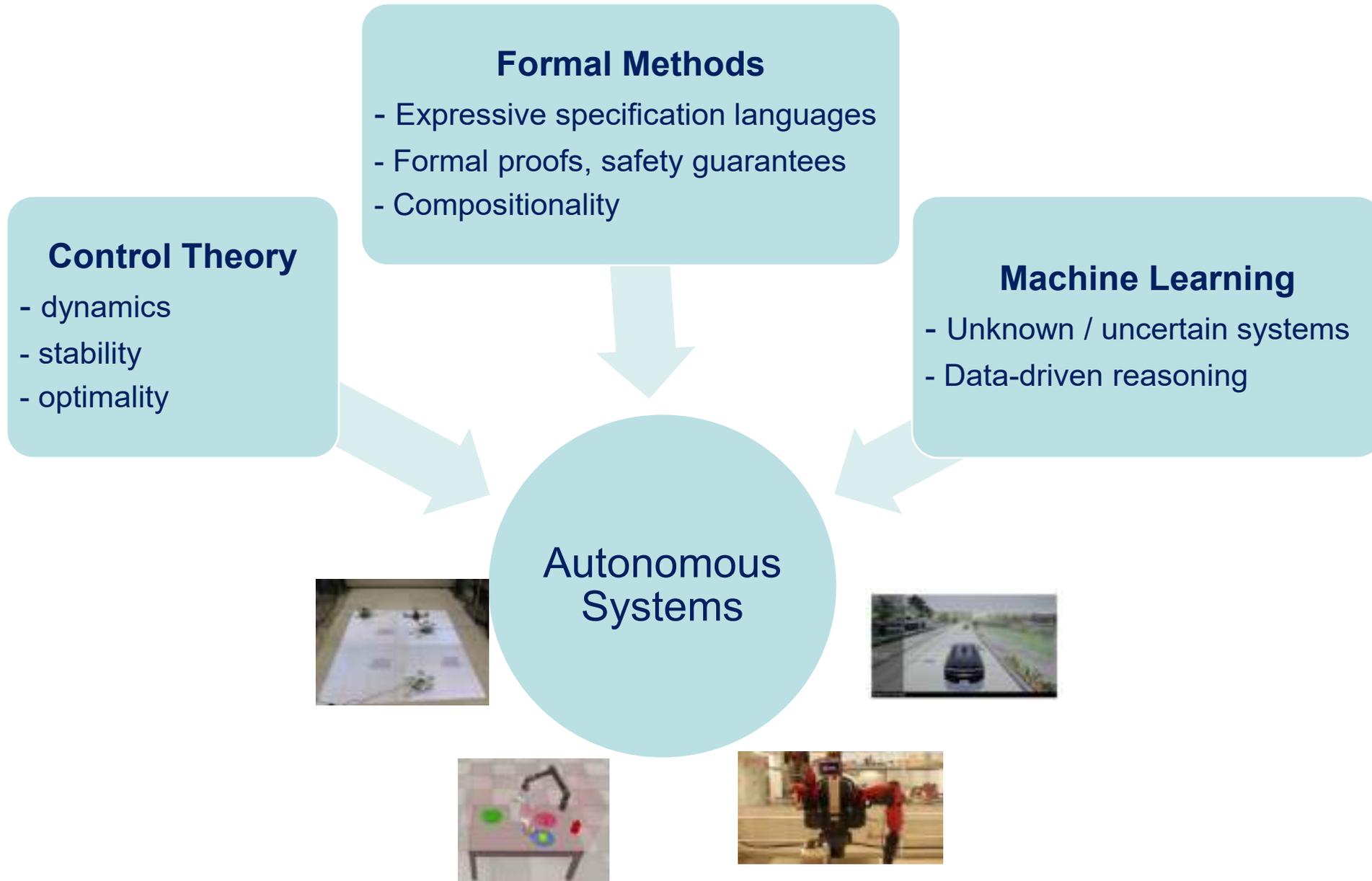
Electrical and Computer Engineering

Systems Engineering

College of Engineering

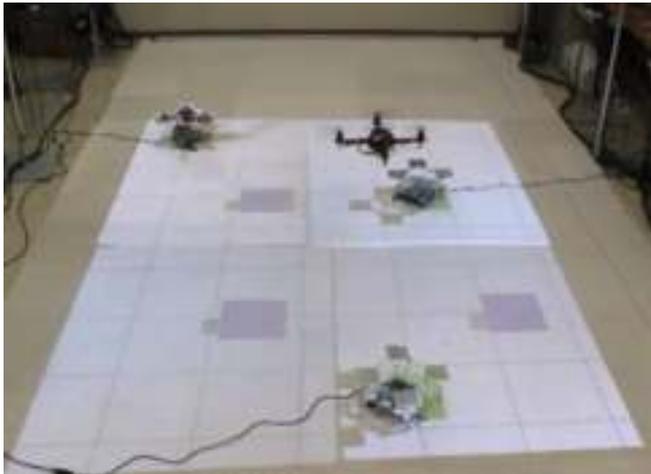


Formal Methods for Autonomy

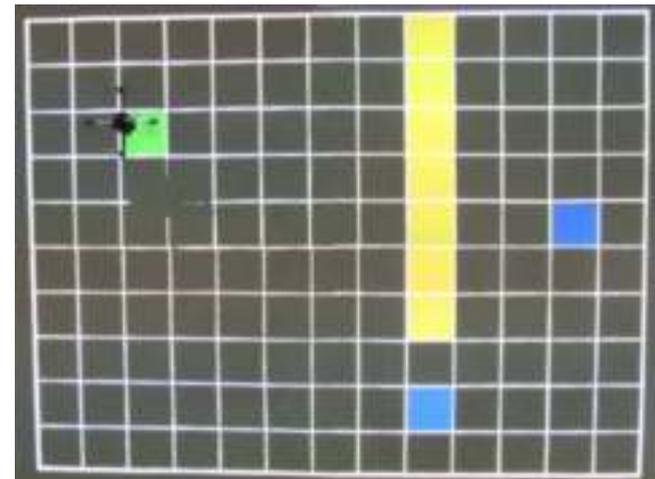
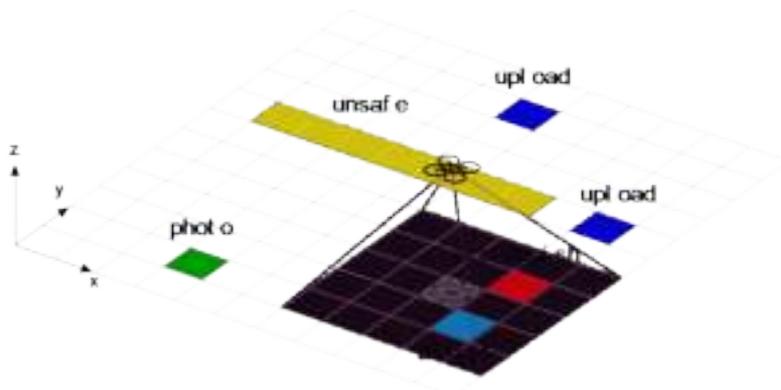


Persistent Surveillance

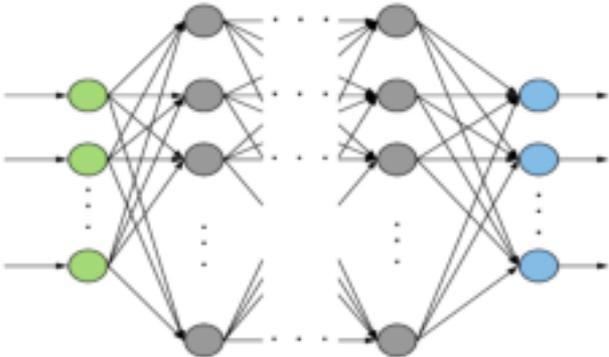
“Service site A for 2 time units within [0, 30] and site C for 3 time units within [0, 19]. In addition, within [0, 56], site B needs to be serviced for 2 time units followed by either A or C for 2 time units within [0, 10].”



Spec: Off-line: “Keep taking photos and upload current photo before taking another photo. **On-line:** Unsafe regions should always be avoided. If fires are detected, then they should be extinguished. If survivors are detected, then they should be provided medical assistance. If both fires and survivors are detected locally, priority should be given to the survivors. Minimize travel time between consecutive uploads.”

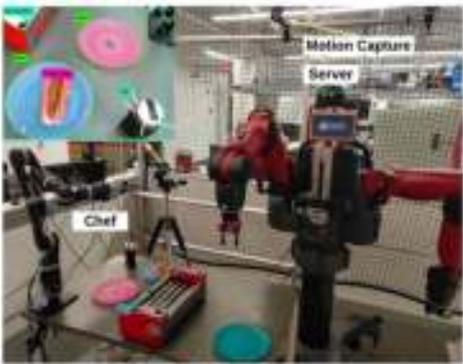


Making and Serving Hotdog

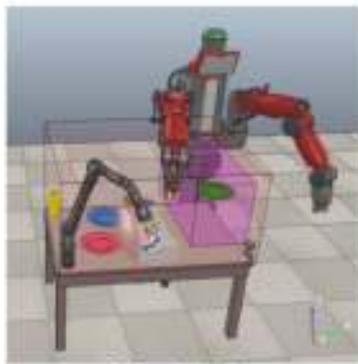


Chef (Jaco): Make a hotdog

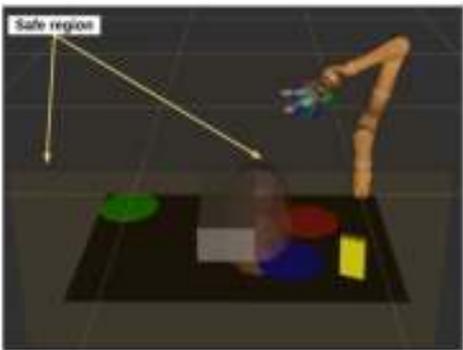
Turn on grill **and then** place sausage on grill **and then** return to home position **and then** wait for 600 seconds **and then** place sausage on the bun **and then** apply ketchup **and then** turn off grill **and then** return to home position



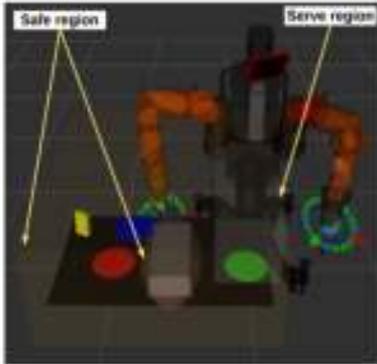
A: Experiment Setup



B: Simulation Setup



C: Jaco environment visualization



D: Baxter environment visualization

Server (Baxter): Serve the hotdog when one is ready and there is a customer

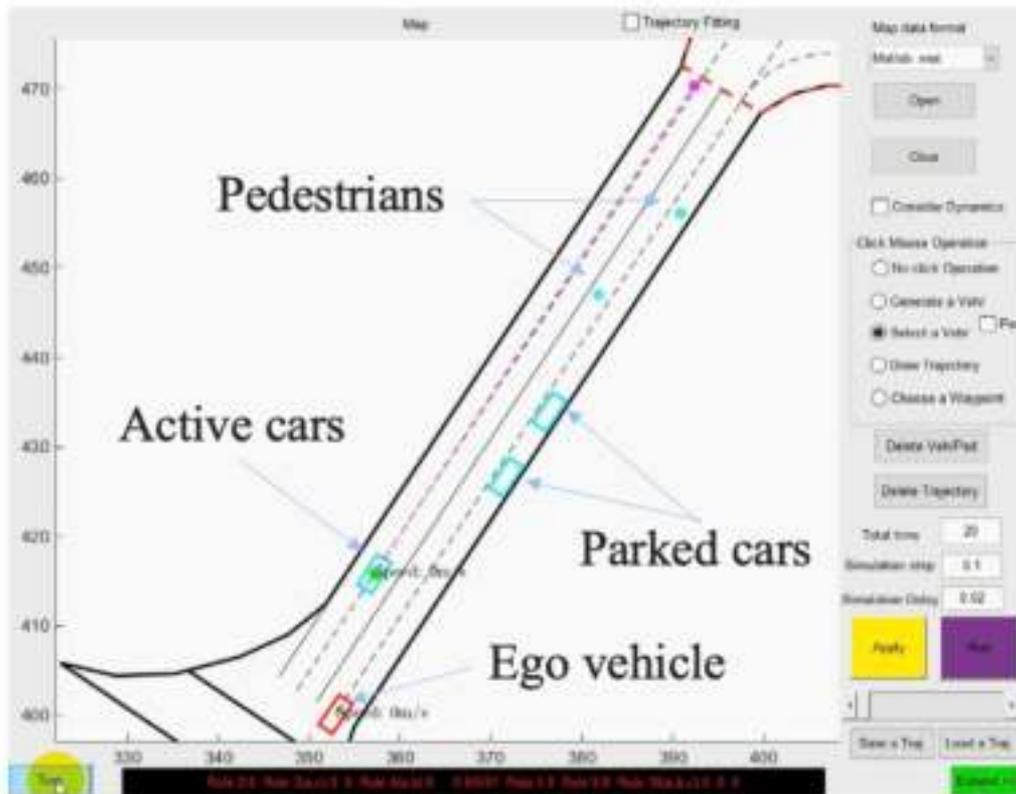
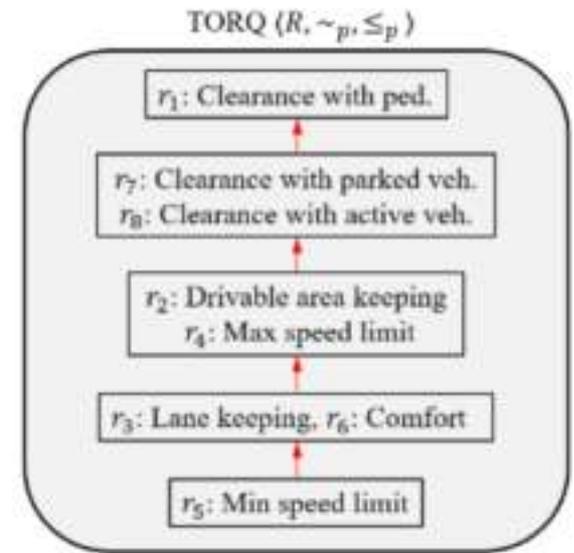
Eventually serve the hotdog **and do not** serve **until** hotdog is ready **and** customer detected





Autonomous Driving using Prioritized Rules

$$\min_u \int_0^T (u^T P u) dt$$



Subject to:

- Dynamics

$$\begin{bmatrix} \dot{s} \\ \dot{r} \\ \dot{\mu} \\ \dot{v} \\ \dot{a} \\ \dot{\delta} \\ \dot{\omega} \end{bmatrix} = \underbrace{\begin{bmatrix} \frac{v \cos(\mu + \beta)}{1 - \kappa r} \\ v \sin(\mu + \beta) \\ \frac{v}{l_v} \sin \beta - \kappa \frac{v \cos(\mu + \beta)}{1 - \kappa r} \\ a \\ 0 \\ \omega \\ 0 \end{bmatrix}}_{f(x)} + \underbrace{\begin{bmatrix} 0 & 0 \\ 0 & 0 \\ 0 & 0 \\ 0 & 0 \\ 1 & 0 \\ 0 & 0 \\ 0 & 1 \end{bmatrix}}_{g(x)} \underbrace{\begin{bmatrix} u_{jerk} \\ u_{steer} \end{bmatrix}}_u$$

- Trajectory tracking (middle of current lane)
- State limitations (steering angle, vehicle speed, etc.)
- Control bounds (jerk, steering acc.)
- Minimum violation of a prioritized set of rules

Navigation, Brains, Fields, and Linear Programming

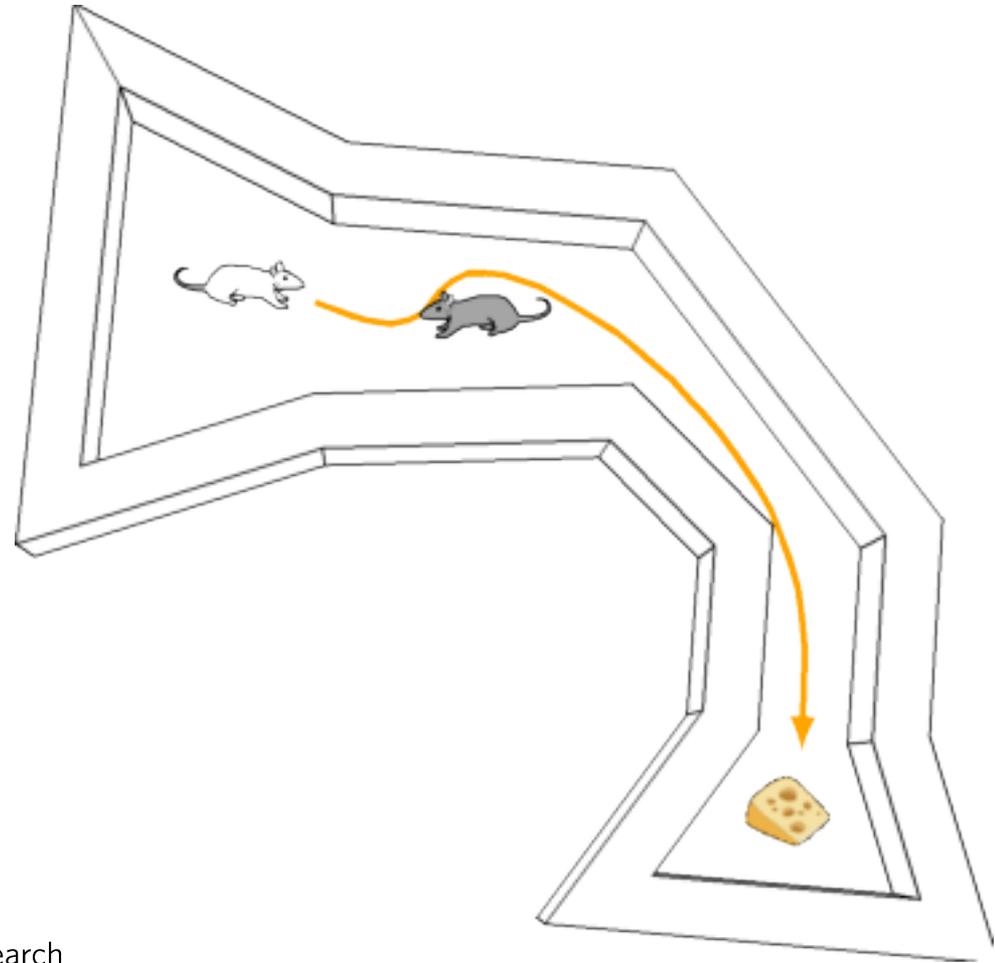
Roberto Tron

Assistant Professor
Mechanical and Systems Engineering
College of Engineering

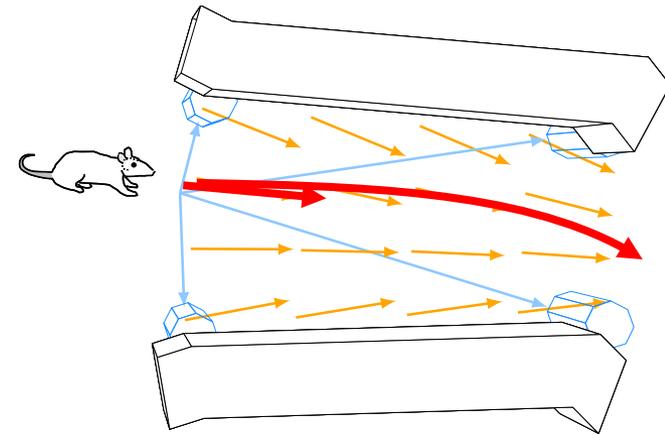


Autonomous navigation

Reach the goal
“without thinking”
and *“robustly”*



Traditional path planning gives only a **single open-loop path**



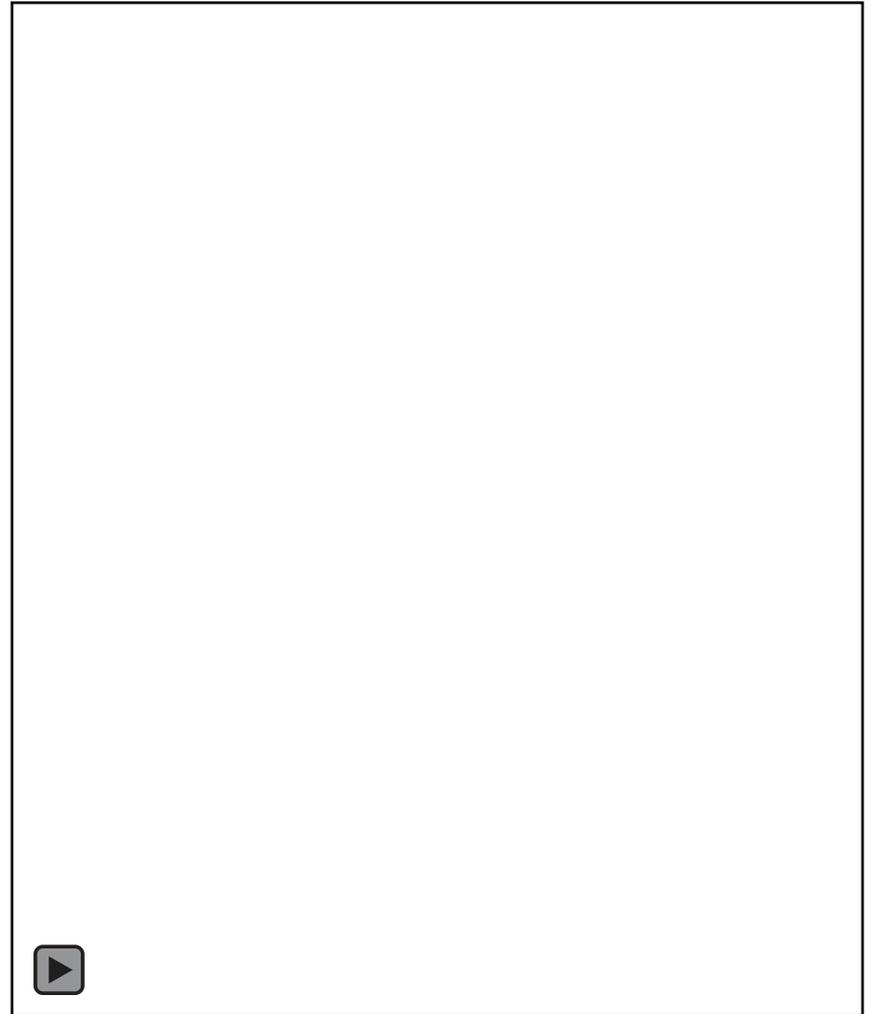
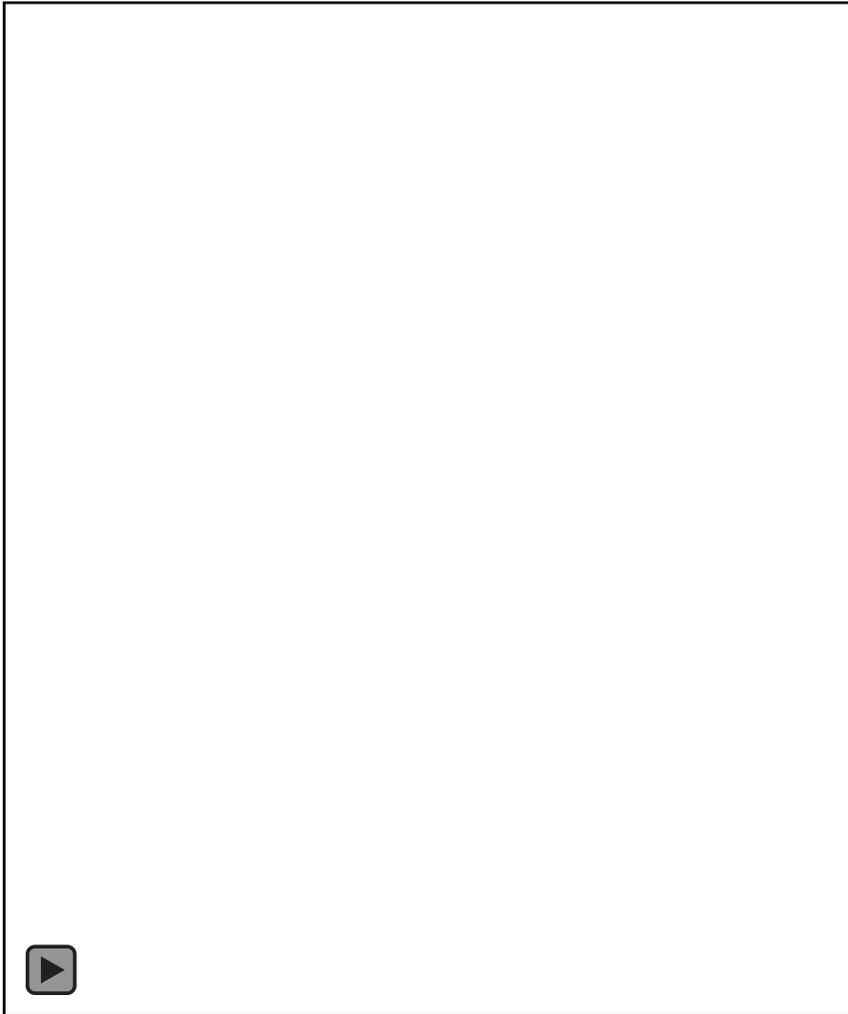
Our approach

- Uses feedback from **measurements**
- Manipulates **field** on entire region

$$u = Ky$$

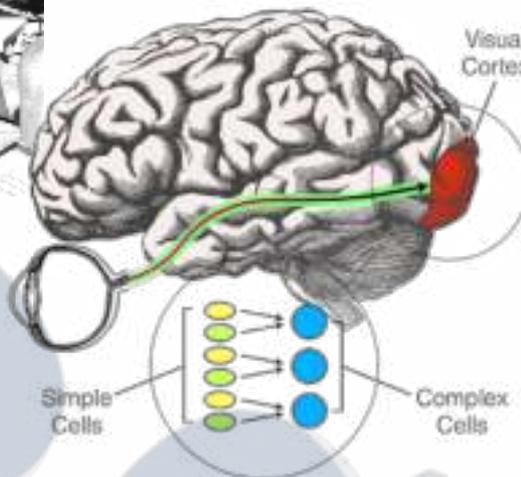
Linear Programming:
Fast and optimal

Experimental results

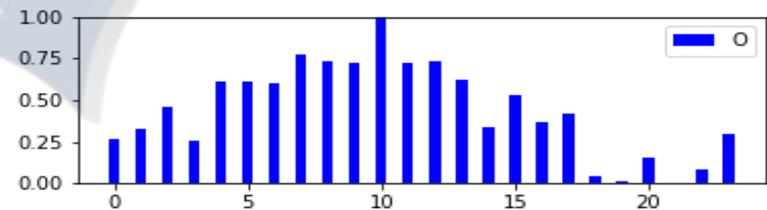
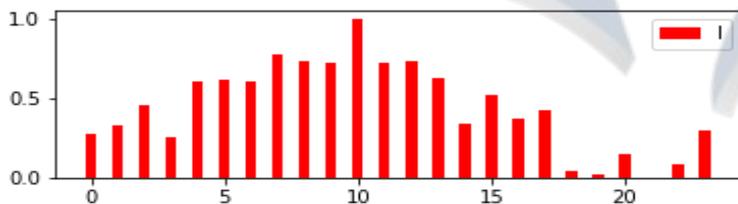


Feedback control → works with deformations

Bio-inspired filtering



Formalize
neuroscience
models with
convergence
guarantees



Byzantine Resilience at Swarm Scale

Wenchao Li

Assistant Professor
Department of Electrical and Computer Engineering
College of Engineering



Robot Swarms

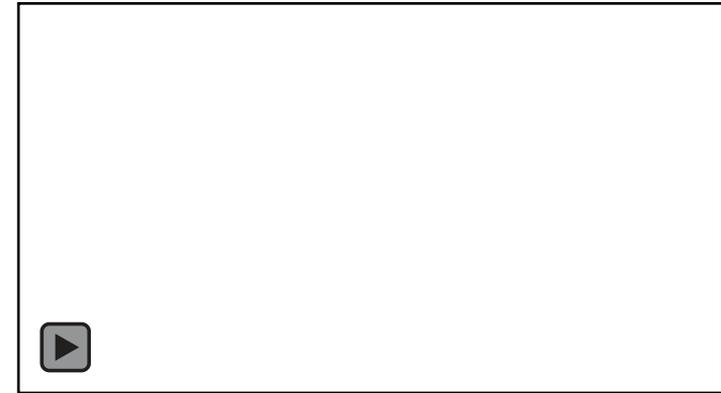
- Shape formation, search and rescue, surveillance & reconnaissance, cooperative target tracking & monitoring, collective transport, etc.



[www.theguardian.com/technology/2015/sep/18/robot-swarms-drone-scientists-hive-mentality]



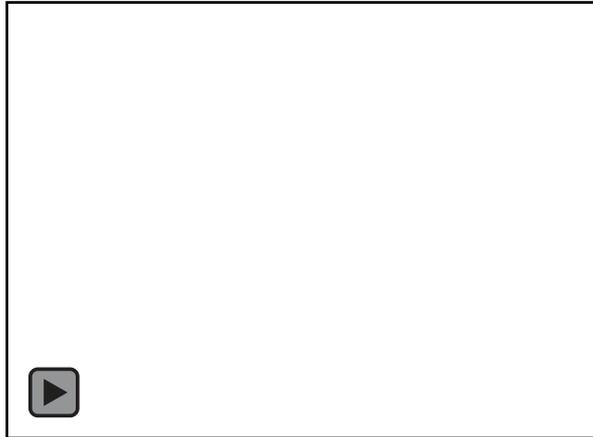
A swarm of robots performing target tracking



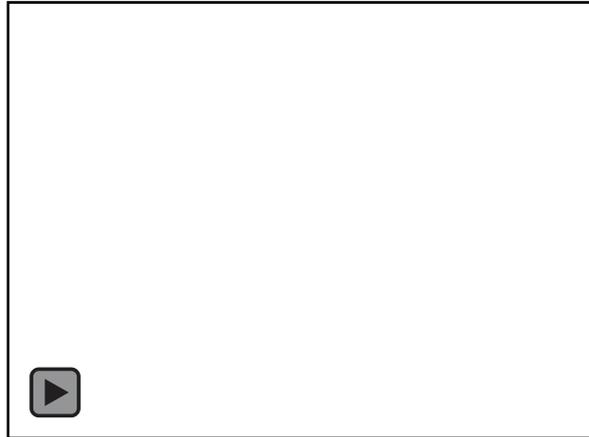
[Youtube: Drone Christmas Show Darling Harbour Sydney]

- **Security and reliability challenges:**
 - Faulty or malicious robots can easily disrupt the function and safety of the swarm
 - **Byzantine threats in multi-robot systems:** an unknown subset of the robots is allowed to have arbitrarily different behaviors relative to the cooperative robots

A swarm of robots performing target tracking: Any robot who does not directly observe the target computes a **consensus** of where the target is based on information communicated by neighboring robots.



No Byzantine Robots



With Byzantine Robots (in red)



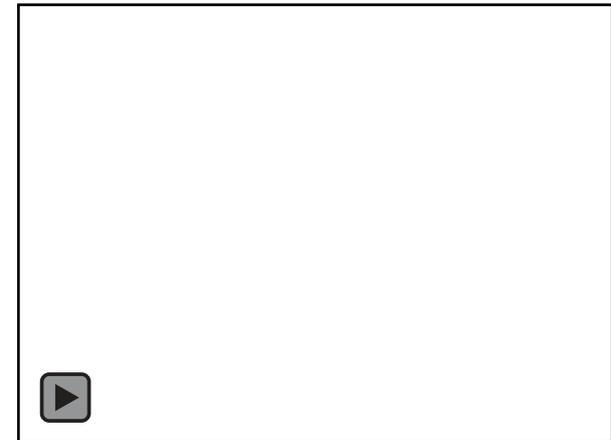
Mitigation using W-MSR¹

Our breakthrough for Byzantine resilience:

- A decentralized blocklist protocol (DBP) based on inter-robot accusations.
- More scalable and less connectivity requirement compared with W-MSR.



Mitigation using DBP²



60 Byzantine 100 Cooperative

1. LeBlanc et al. Resilient Asymptotic Consensus in Robust Networks. IEEE Journal on Selected Areas in Communications, 2013.

2. Wardega et al. Byzantine Resilience at Swarm Scale: A Decentralized Blocklist Protocol from Inter-robot Accusations. AAMAS 2023.

Designing Semi-Cooperative Robot Teams

Alyssa Pierson

Assistant Professor
Mechanical Engineering
College of Engineering



Coordinating Multi-Agent Systems

Complexity of Environment



Complexity of Interactions



How do we design teams with:

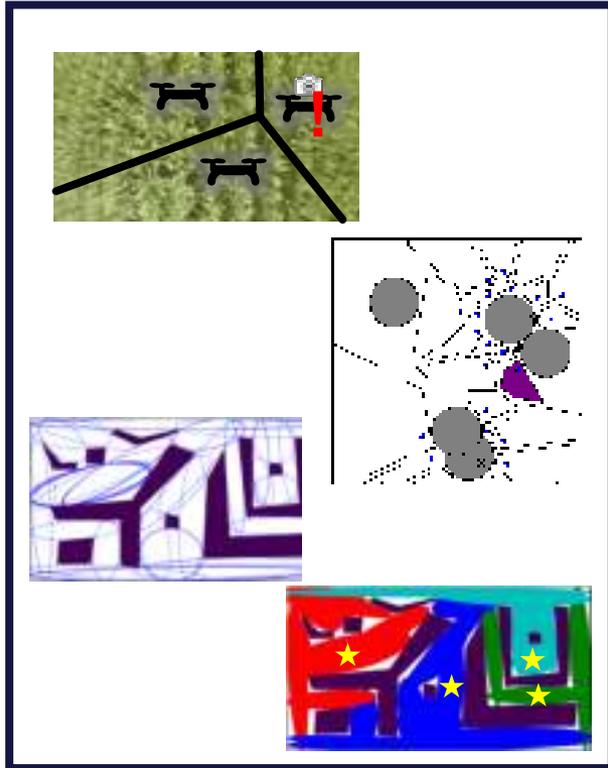
- Performance variations?
- Uncertainty?
- Non-cooperative teammates?
- Human teammates?

All cooperative
Equal performance

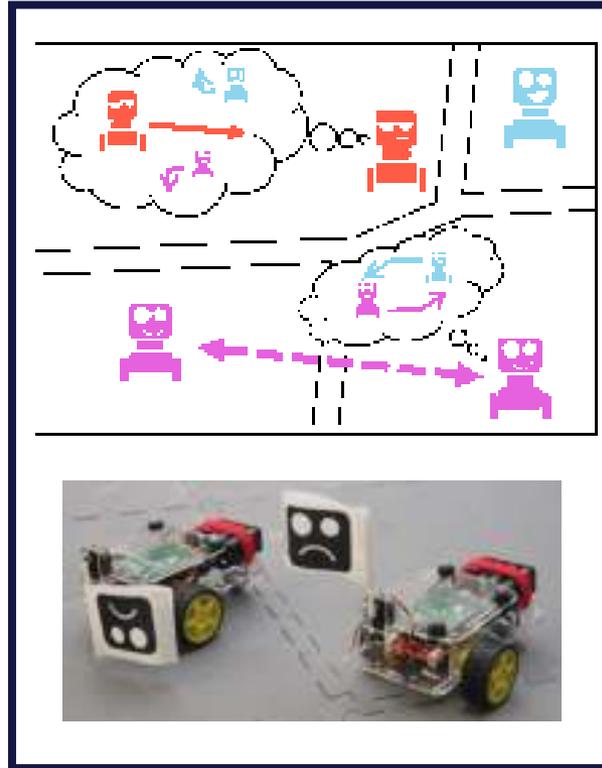
Malicious agents



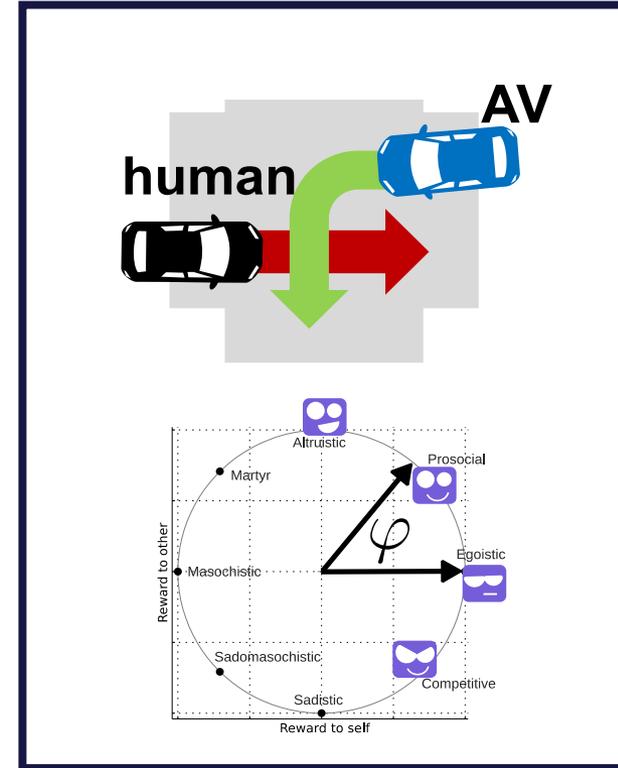
Engineering Group Autonomy



**Geometric
Methods**



**Controls & Game
Theory**



**Dynamic
Interactions**

Engineering Group Autonomy



Functional Kirigami

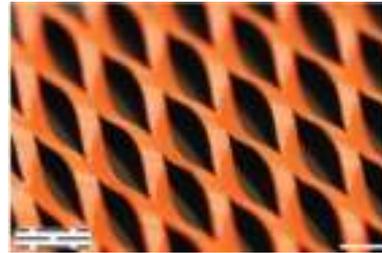
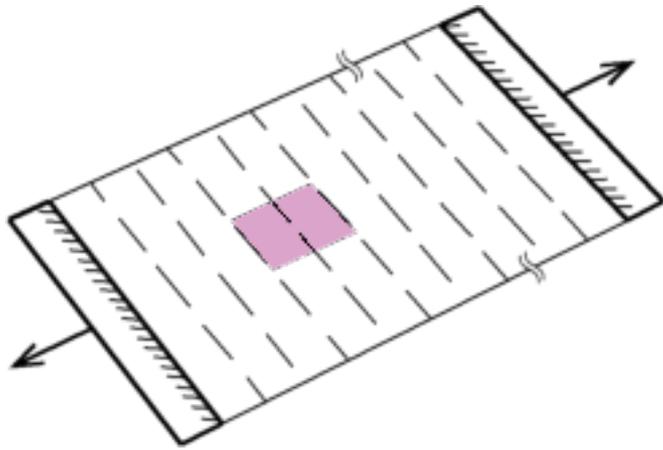
Muscles, Grippers, Logic, and Actuators

Douglas P. Holmes

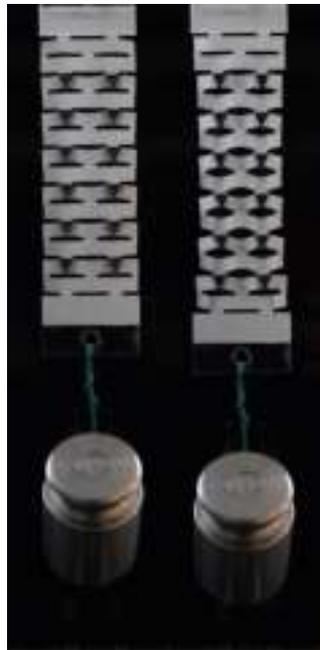
Associate Professor
Mechanical Engineering
College of Engineering



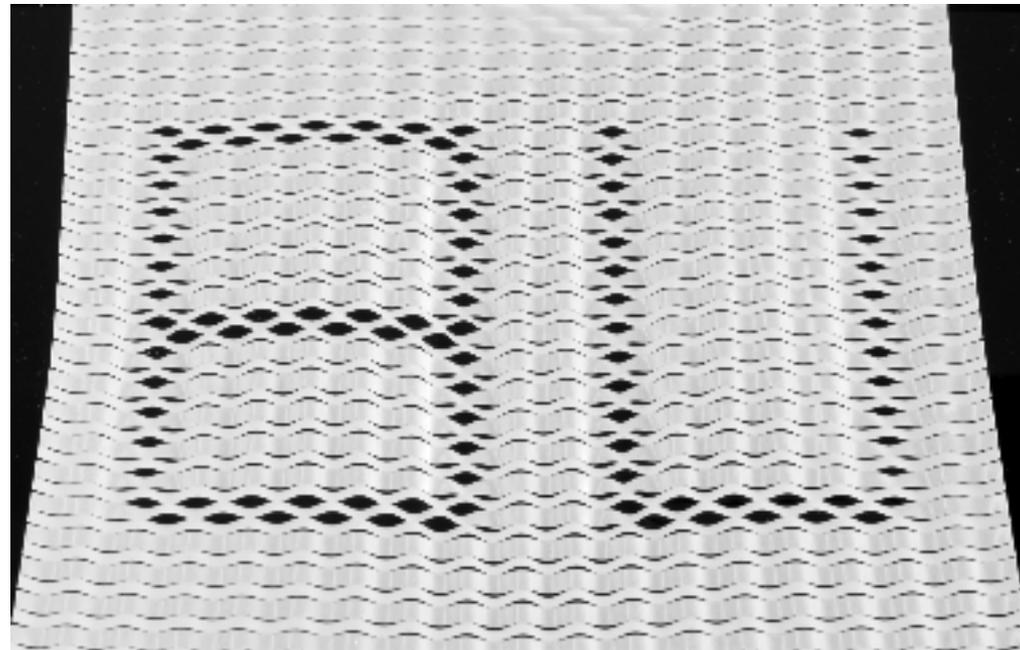
Cuts in a Sheet



Increase Cut Spacing

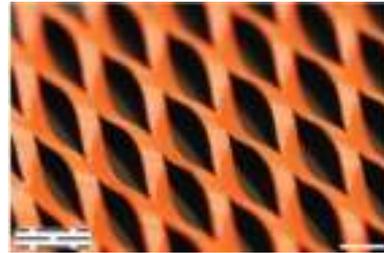
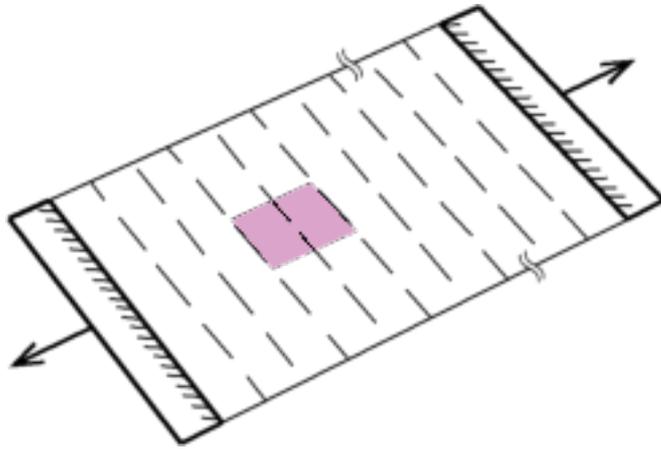


Switching changes the stiffness



Each unit cell is bistable

Cuts in a Sheet



Increase Cut Spacing



Add Curvature

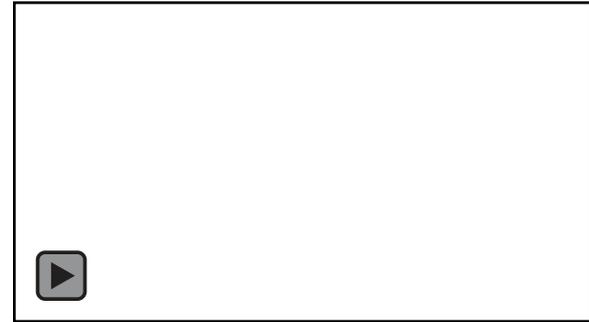
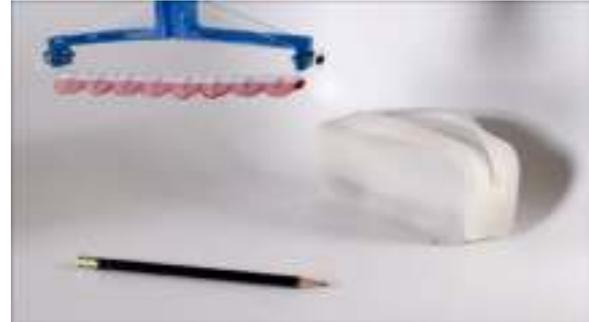
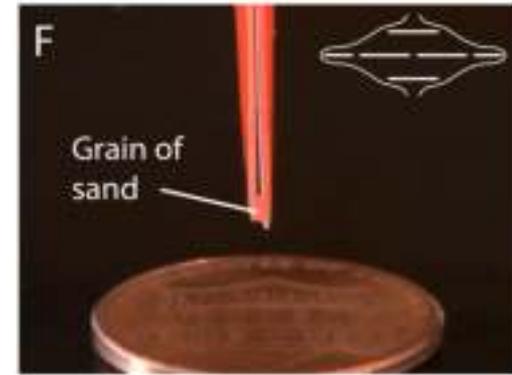
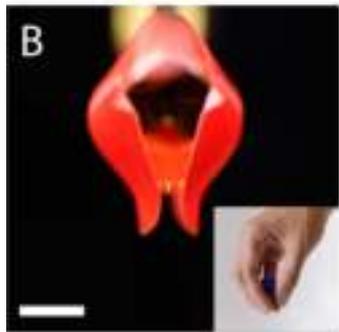
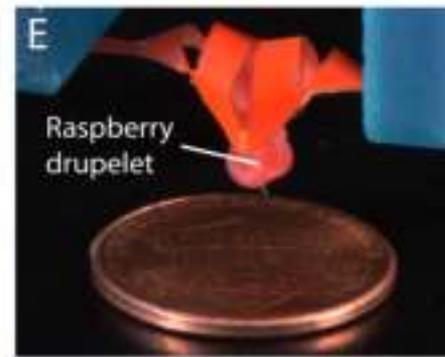
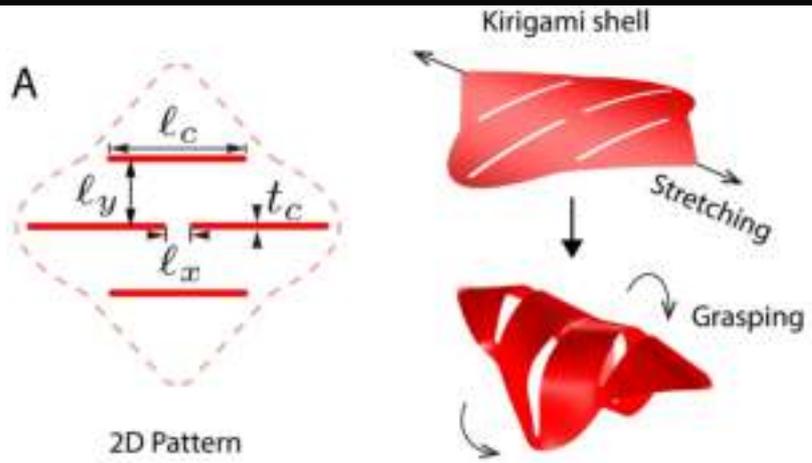


Grasping

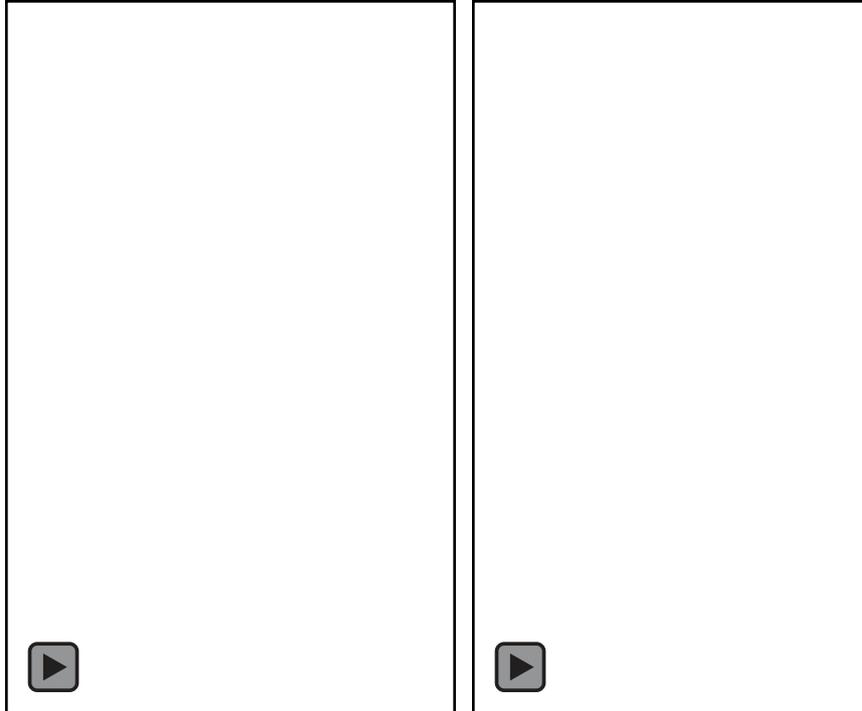


Kirigami Gripper

Y. Yang, K. Vella, and D.P. Holmes, "Grasping with Kirigami Shells," *Science Robotics*, 6, eabd6426, (2021).



Linear Actuators



Pitch

Roll

M.A. Dias, M.P. McCarron, D. Rayneau-Kirkhope, P.Z. Hanakata, D.K. Campbell, H.S. Park, and D.P. Holmes, "Kirigami Actuators," *Soft Matter*, 13, 9087–9092, (2017).

Mechanical Logic



Y. Yang, J. Feng, and D.P. Holmes, "Kirigami Logic," *In Preparation*, (2023).



Soft Robotic Exosuits For Post-Stroke Locomotor Recovery

Lou Awad, PT, DPT, PhD

Assistant Professor
Department of Physical Therapy
College of Health and Rehabilitation Sciences: Sargent

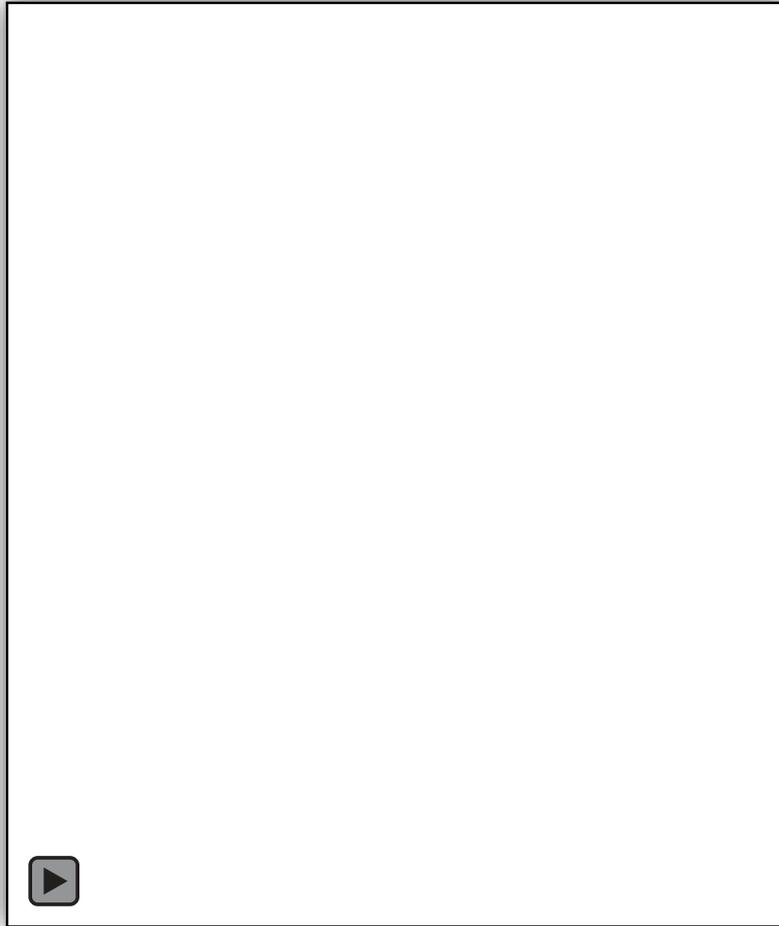
<https://sites.bu.edu/NRL>
louawad@bu.edu



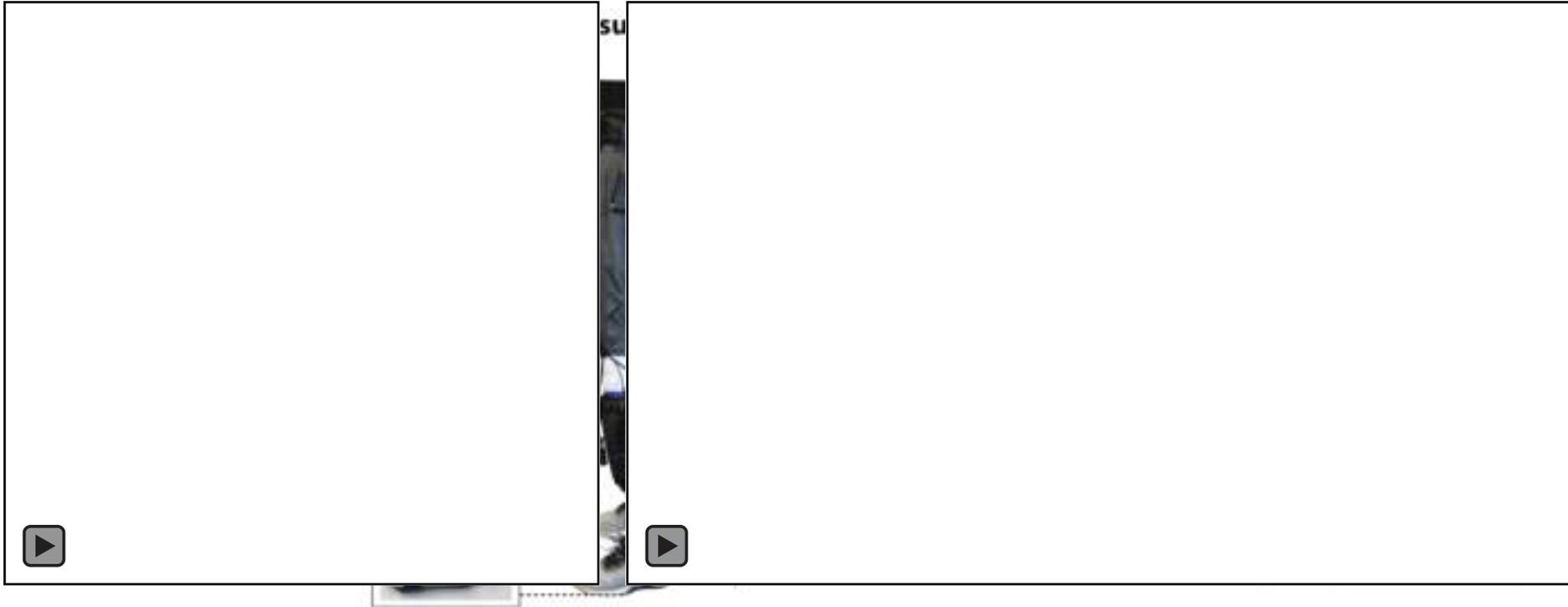
< 3500 steps per day of physical activity

Poor health and reduced quality of life

A New Paradigm: Soft Robotic Exosuits For Assistance & Rehabilitation

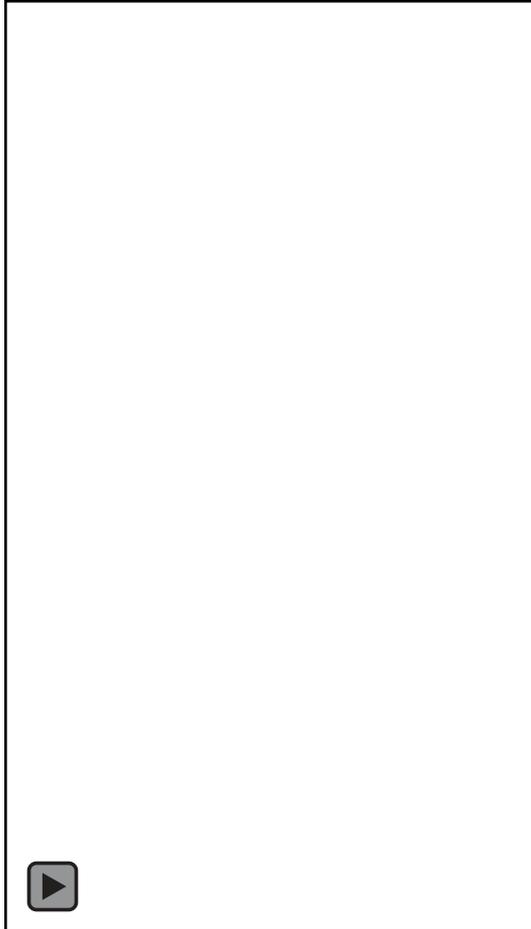


A New Paradigm: Soft Robotic Exosuits For Assistance & Rehabilitation



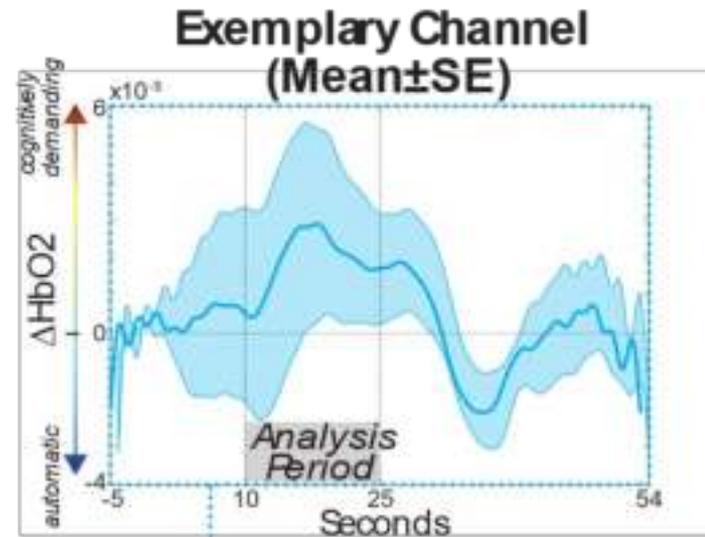
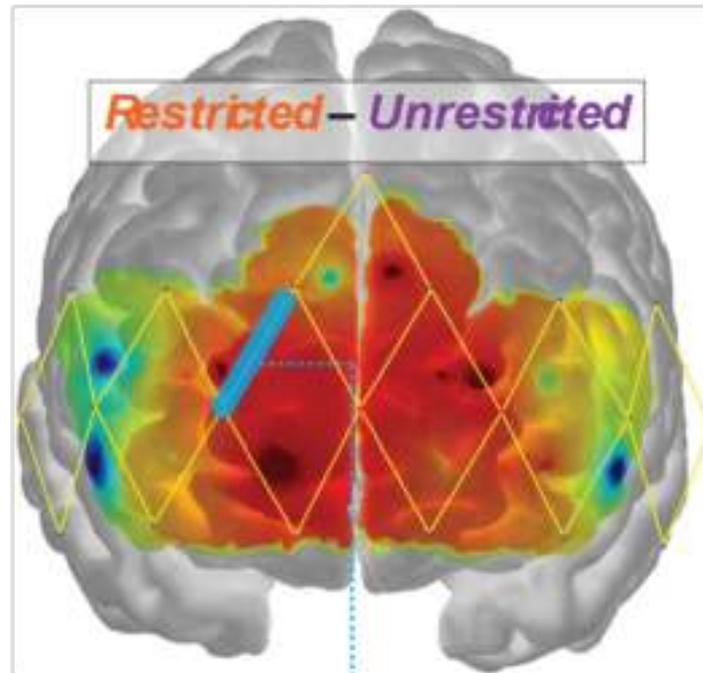
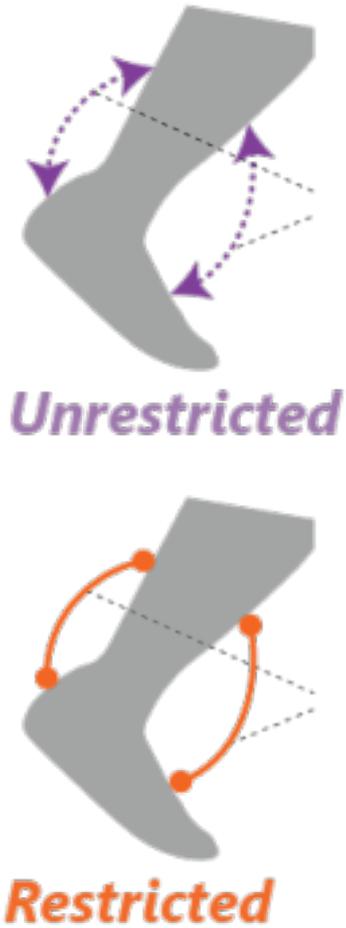
- Awad et al. A soft robotic exosuit improves walking after stroke. *Science Translational Medicine*. 2017
- Awad et al. Reducing circumduction and hip hiking during hemiparetic walking with a soft robotic exosuit. *Amer J Phys Med Rehab*. 2017
- Awad et al. Walking faster and farther with a soft robotic exosuit: Implications for post-stroke gait assistance and rehabilitation. *IEEE OJEMB*. 2020
- Awad et al. These legs were made for propulsion: Advancing the diagnosis and treatment of post-stroke propulsion deficits. *J NeuroEngineering & Rehab*. 2020
- Sloutsky et al. Targeting post-stroke walking automaticity with a propulsion-augmented soft robotic exosuit. *IEEE Conf Neural Engineering*. 2021
- Porciuncula et al. Targeting paretic propulsion and walking speed with a soft robotic exosuit: A consideration-of-concept trial. *Frontiers Neurorobotics*. 2021
- Roto et al. Enhancing neuroplasticity after stroke: Effects of a soft robotic exosuit on exercise intensity and brain-derived neurotrophic factor. *IEEE OJEMB*. 2023

Exosuits *supplement* the work (and thinking)



Exosuits *supplement* the work (and thinking)

Walking with a mismatched exosuit...





Franchino Porciuncula
(Research Scientist)



Johanna Spangler
(Research PT)



Teresa Baker
(Research PT)



Karen
Hutchinson
(Clinical Faculty)



Andre Alvarez
(PhD student)



Ashlyn Aiello
(PhD student)



Regina Sloutsky
(PhD student)



Dheepak Arumukhom
Revi (PhD Student)



Ashley Collimore
(PhD student)



Anna Roto
(PhD Student)



Stefano DeRossi
(Visiting Scientist)



Dave Sherman
(Postdoc)



Neuro*motor Recovery Laboratory



Terry Ellis



Conor Walsh



Paolo Bonato



Joan Breen

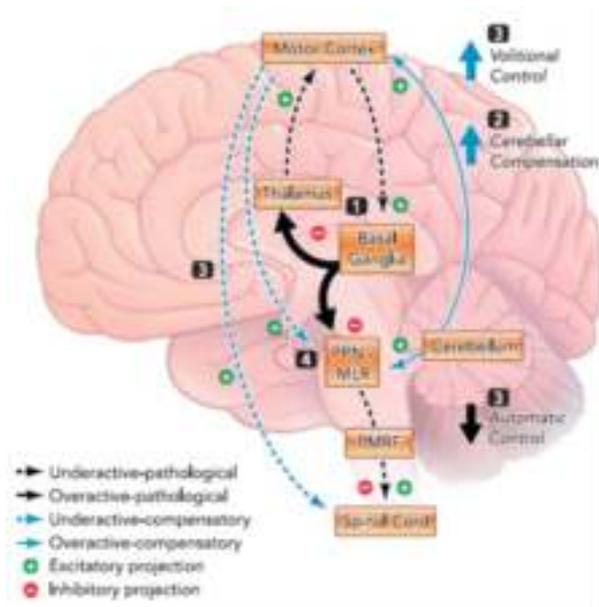


Robotic Apparel to Prevent Freezing of Gait In Persons with Parkinson Disease

Terry Ellis, PhD, PT

Associate Professor & Chair
Department of Physical Therapy
College of Health & Rehabilitation Sciences: Sargent
<https://www.bu.edu/neurorehab/>

Freezing of gait (FOG) is a brief episodic absence or marked reduction in forward progression of the feet despite the intention to walk.

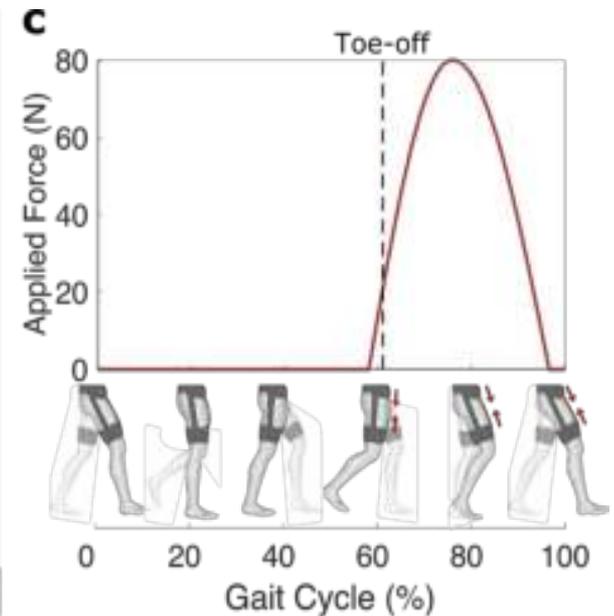
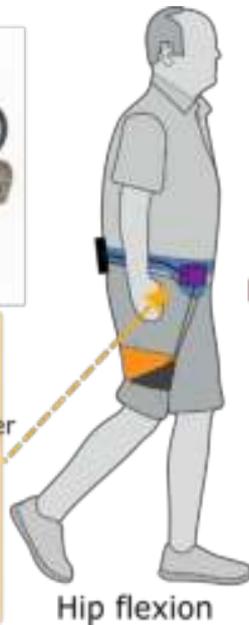


Loss of walking automaticity

Peterson, 2016



Soft Robotic Hip Flexor System



Duration of FOG

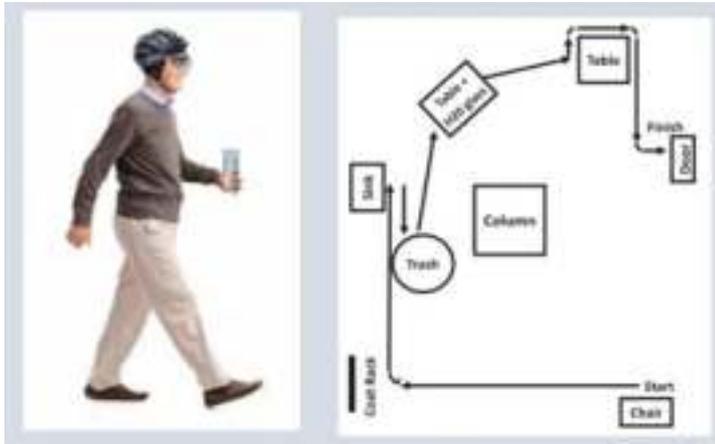
40% “time spent frozen”
with exosuit “off”
0 episodes of FOG with
exosuit “on”

Clinical Outcomes & Next Steps

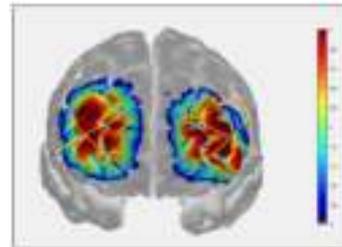
Future....

With the Exosuit powered “on”:

- Faster gait speed
- Longer distance walking
- Longer step lengths



Improving walking automaticity?



Thank You Collaborators & Center for Neurorehabilitation Team



Conor Walsh, PhD
Harvard University



Lou Awad, PT, PhD
Boston University



Franchino Porciuncula,
PT, DScPT, EdD
Boston University



Jinsoo Kim, PhD
Harvard University



Tim Nordahl,
PT, DPT, NCS
Boston University



Nicholas Wendel,
PT, DPT, NCS
Boston University



Teresa Baker,
PT, DPT, NCS
Boston University



Ludy Shih, MD
Department of Neurology
BUMC



Interactive Autonomy at Scale

Eshed Ohn-Bar

Assistant Professor

Electrical and Computer Engineering

College of Engineering

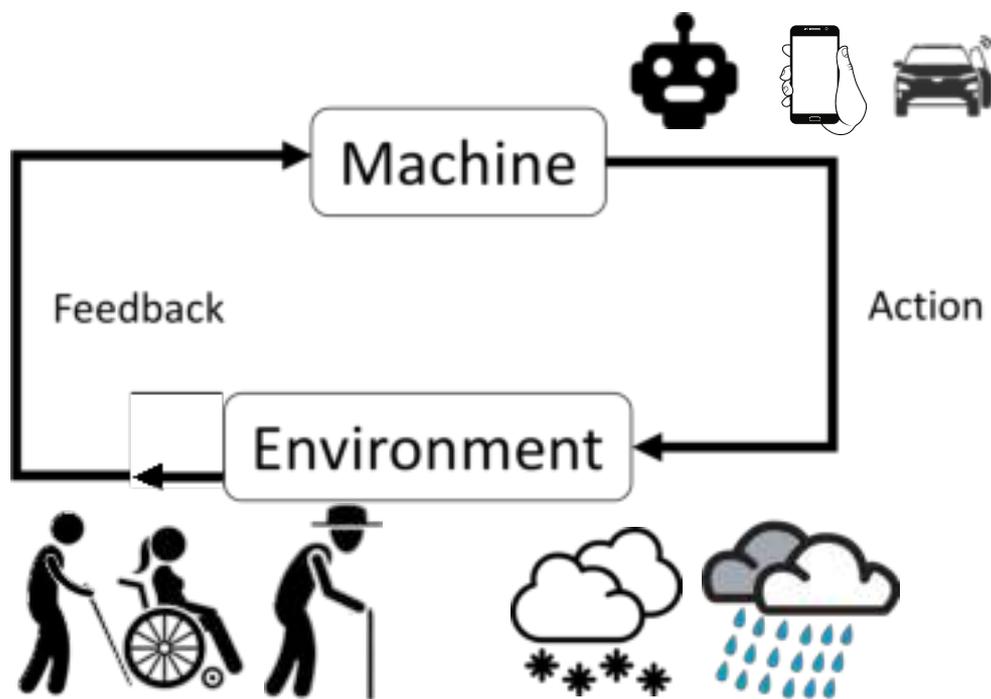
Human-to-Everything (H2X) Lab at BU

mobility@bu.edu



Why? Seamless Interaction

Main Tool: Machine learning with feedback and real-world data for *perception-cognition-action* systems



Personalized Assistive Systems

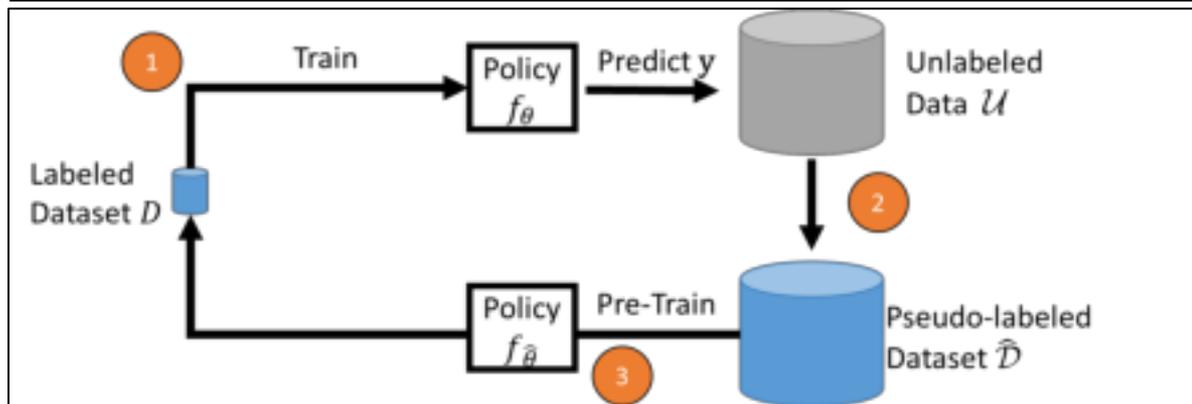


Robust Perception & Autonomy

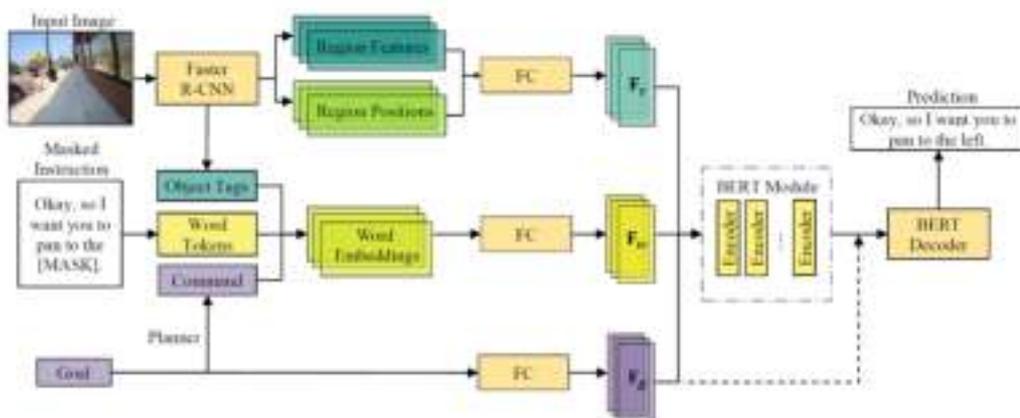


Leveraging Vast Amounts of Freely Available Data for 20% Better Driving

the Web



Goal-Driven Personalized Assistive Policies



Towards Seamless Interaction in the Real-World



On-Going Research

- Coupling **high-dimensional perception** input with interaction and assistance under hard real-time safety constraints.
- Usability and **customization** for users and settings.

Soft Material Robotics and Next-Generation Surgical Robots

Sheila Russo, Ph.D.

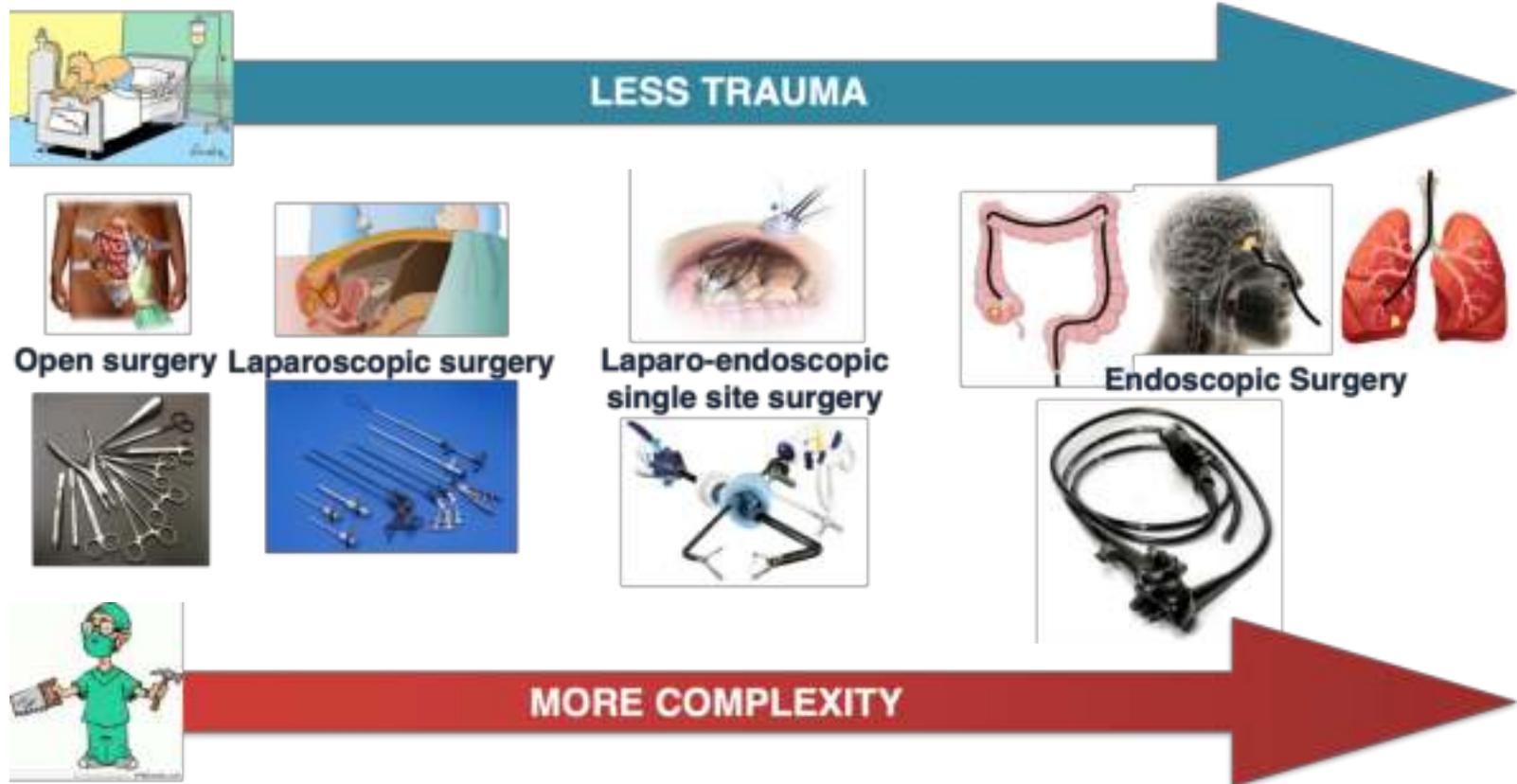
Assistant Professor
Material Robotics Lab
Department of Mechanical Engineering
Division of Materials Science & Engineering
College of Engineering



Open *societal* challenges and unsolved *robotics* challenges

Q1: How do we guarantee **high-quality healthcare**?

Q2: How do we address **healthcare inequality**?



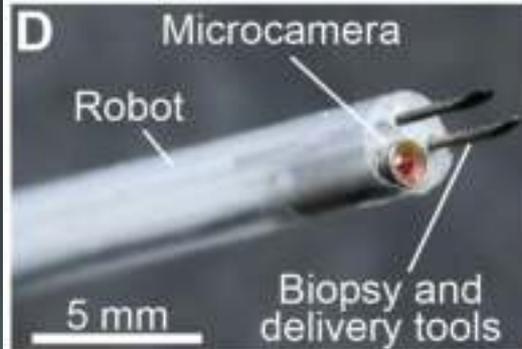
Q2: How can robots **navigate** in a complex and unstructured environment?

Q3: How can robots **manipulate** fragile and delicate objects?

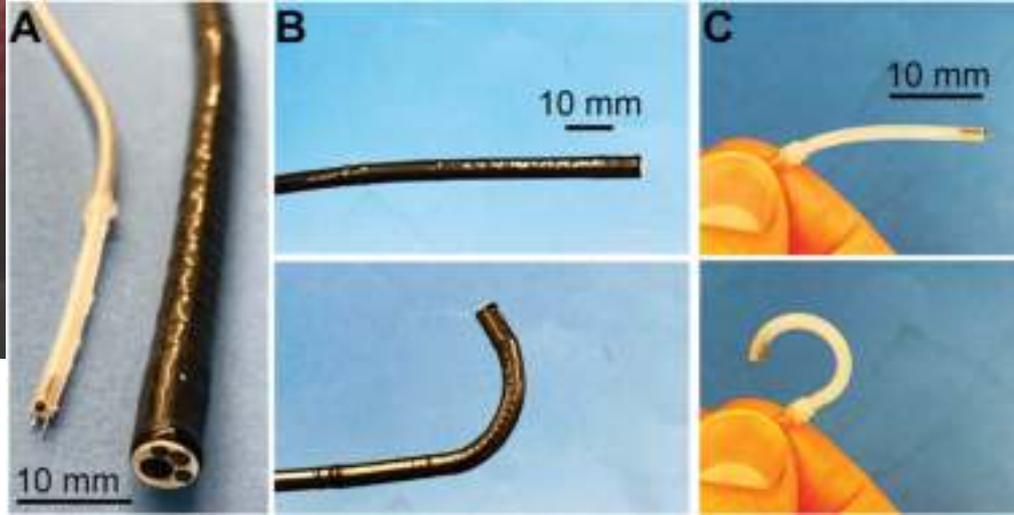
Q4: How can robots achieve safe distal **actuation**, integrated **sensing**, articulation, and effective **force transmission** while in close contact with humans?

Soft Robotics

SoRo



Funding:



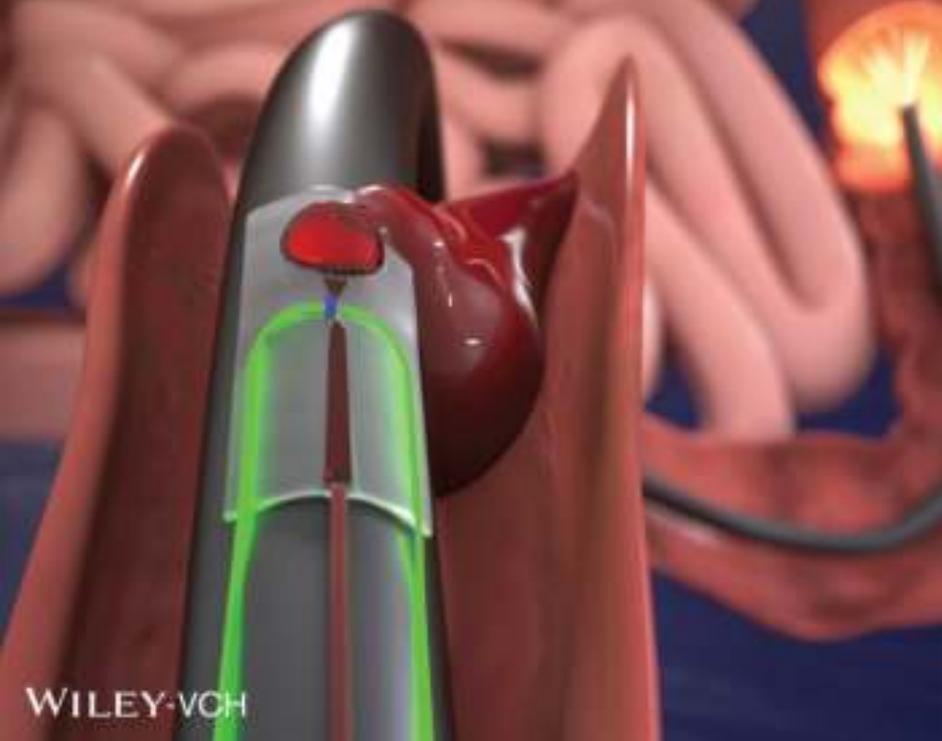
Collaborators:



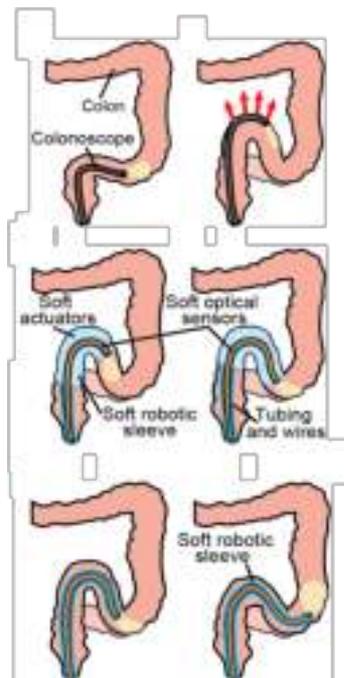
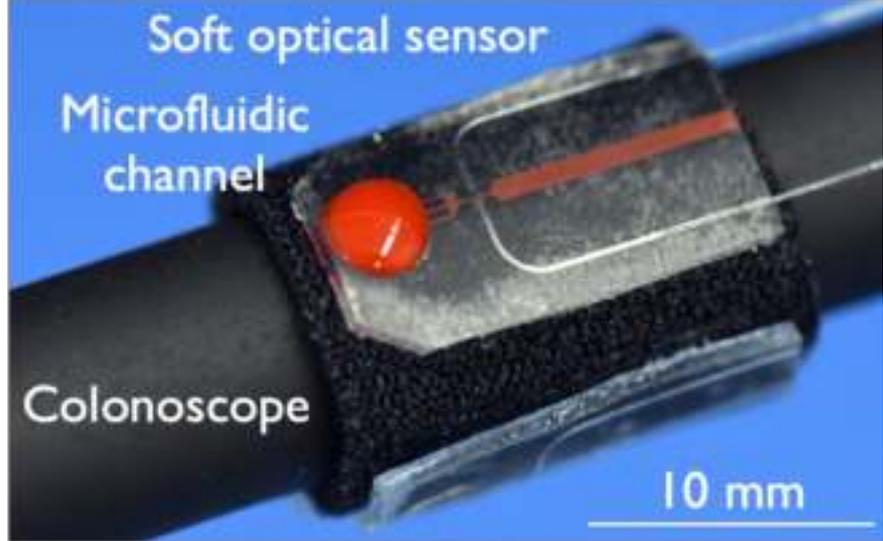
McCandless M., Perry A., DiFilippo N., Carroll A., Billatos E., Russo S., *Soft Robotics*, 2021.
 Van Lewen D., Janke T., Lee H., Austin R., Billatos E., Russo S., *Advanced Intelligent Systems*, 2023.

ADVANCED INTELLIGENT SYSTEMS

Open Access



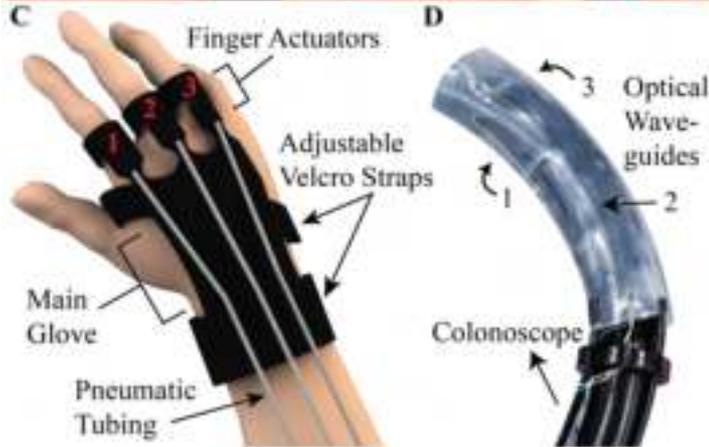
WILEY-VCH



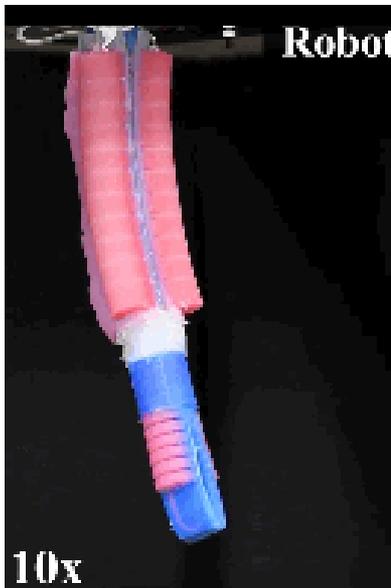
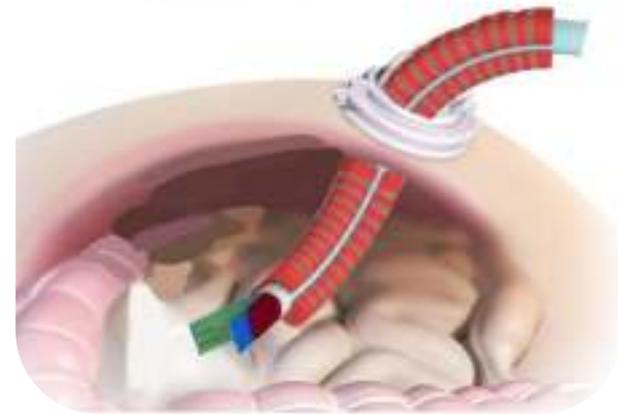
Funding:

National Institute of Biomedical Imaging and Bioengineering

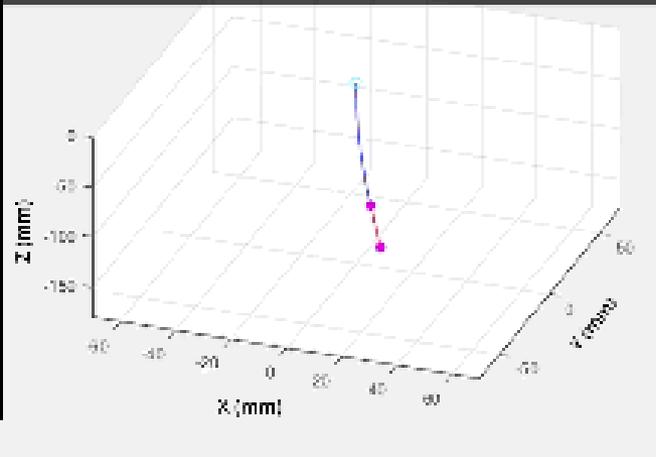
Collaborators:   **HARVARD MEDICAL SCHOOL**



Clinical Evaluation



Robotic System Validation Experiments: Shape Sensing



Collaborators:



Funding:



Gerald, A., Batiwala, R., Ye, J., Hsu, P., Aihara, H. and Russo, S., 2022, October. A Soft Robotic Haptic Feedback Glove for Colonoscopy Procedures. In *2022 IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS)* (pp. 583-590). IEEE.
 McCandless, M., Wise, and Russo, S., 2023. A Soft Robot with Three Dimensional Shape Sensing and Contact Recognition Multi-Modal Sensing via Tunable Soft Optical Sensors. In *2023 IEEE International Conference on Robotics and Automation (ICRA)*. IEEE.



Enabling Robots to Function in Complex and Unstructured Environments

Tom Ranzani

Assistant Professor

Department of Mechanical Engineering

Department of Biomedical Engineering

Material Science & Engineering Division

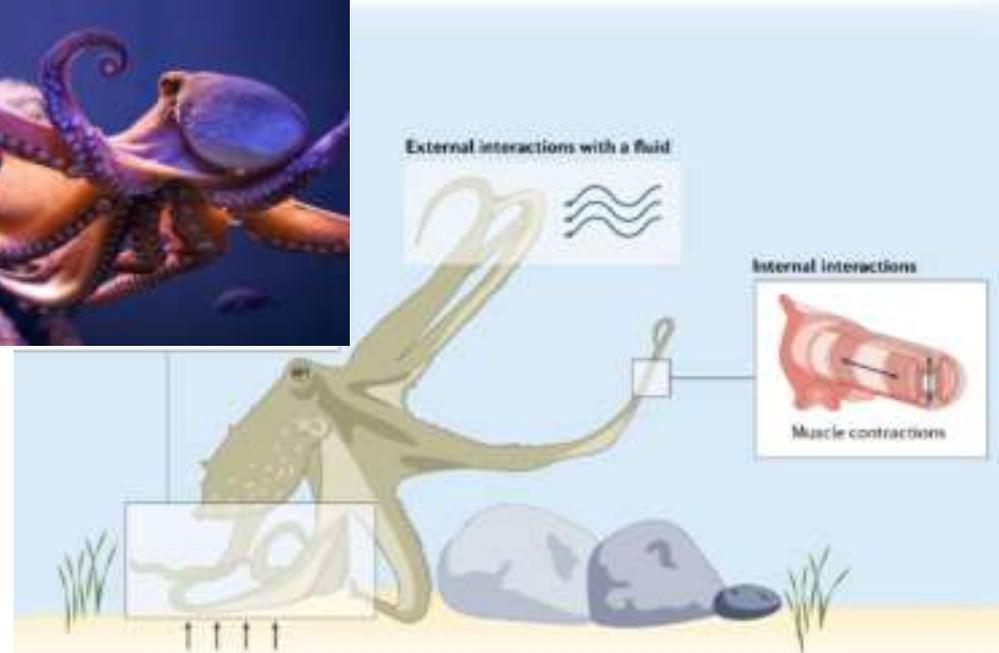
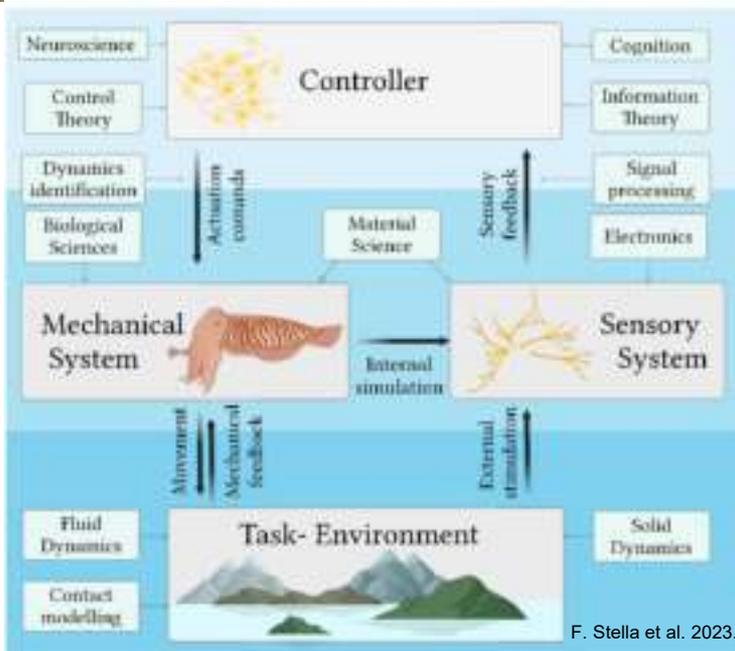
College of Engineering



High predictability
Programmability



Low predictability
Uncertainty



**How do we replicate complexity of biological systems into artificial devices?
How can we control and leverage such complexity to operate in unstructured environments?**

Swimming

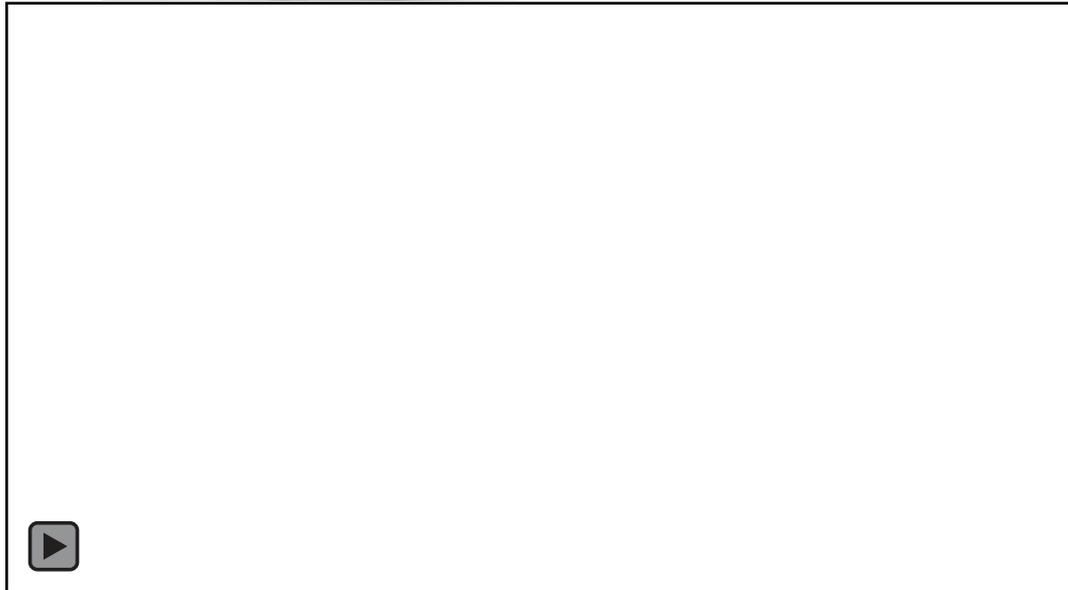
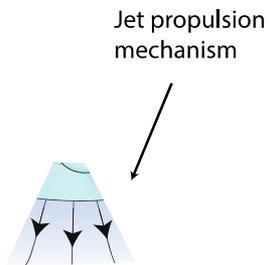
Crawling

Manipulation

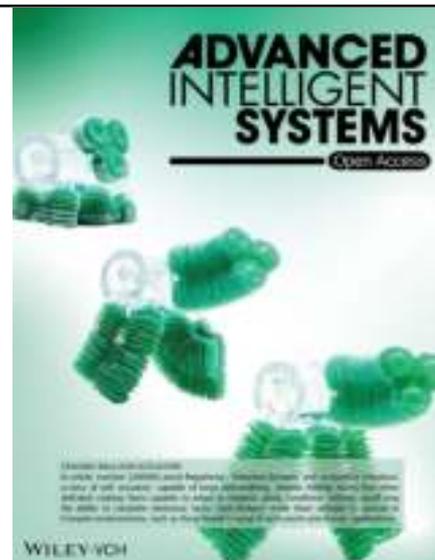
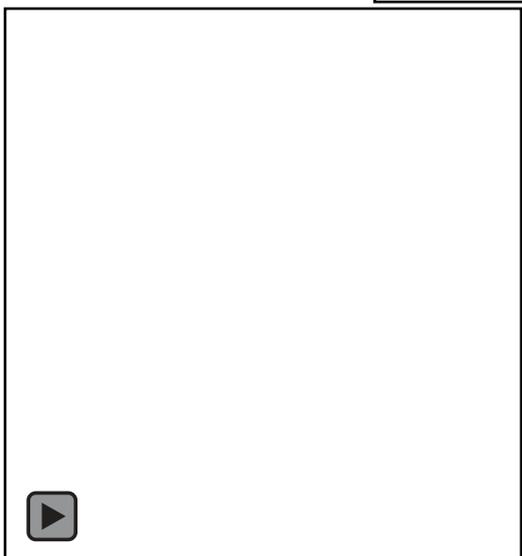


a)

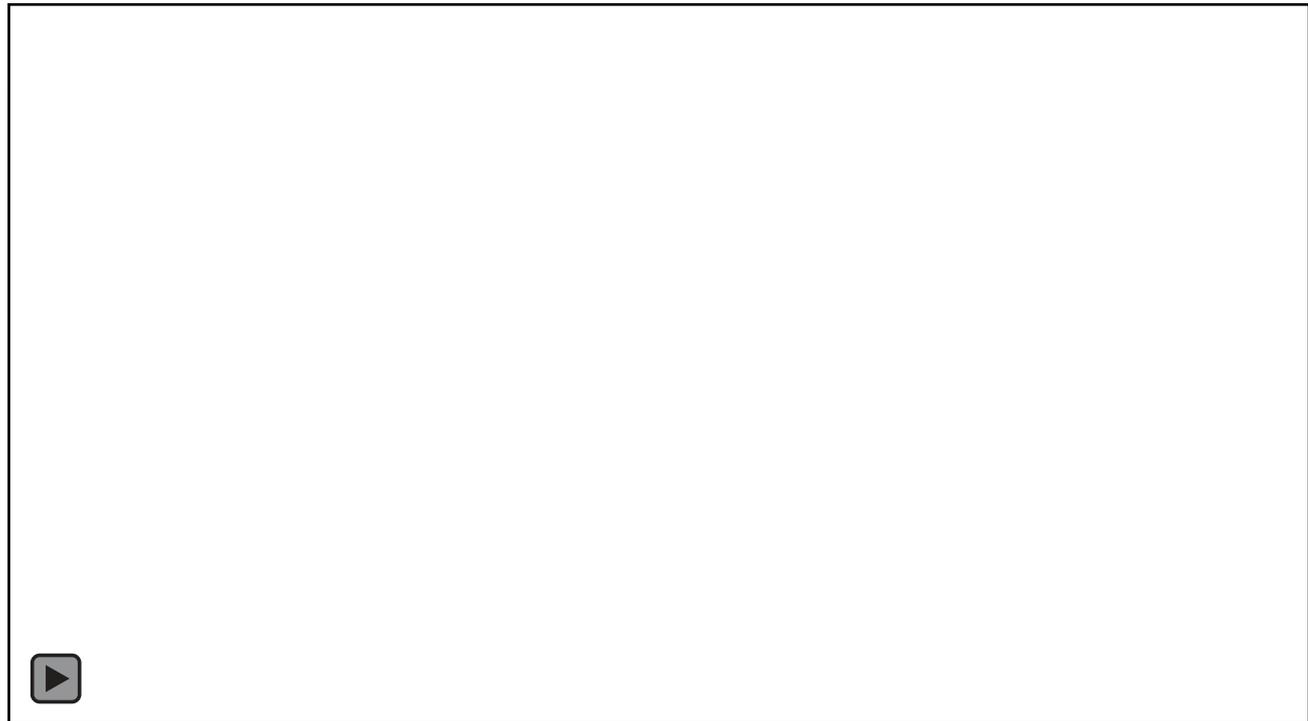
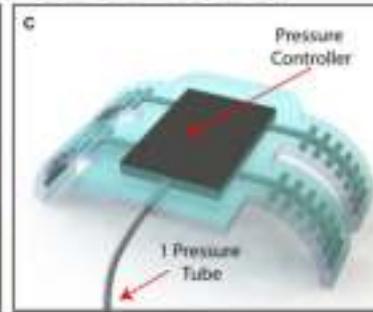
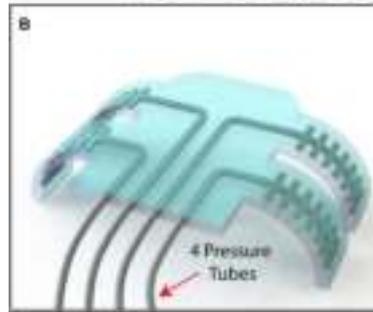
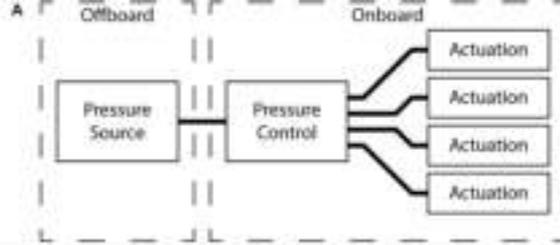
b)



c)



J. Rogatinsky *et al.*, "A Collapsible Soft Actuator Facilitates Performance in Constrained Environments," *Adv. Intell. Syst.*, vol. 2200085, p. 2200085, Jun. 2022



K. McDonald, L. Kinnicutt, A. M. Moran, and T. Ranzani, "Modulation of Magnetorheological Fluid Flow in Soft Robots Using Electropermanent Magnets," *IEEE Robot. Autom. Lett.*, vol. 3766, no. c, pp. 1–1, 2022.

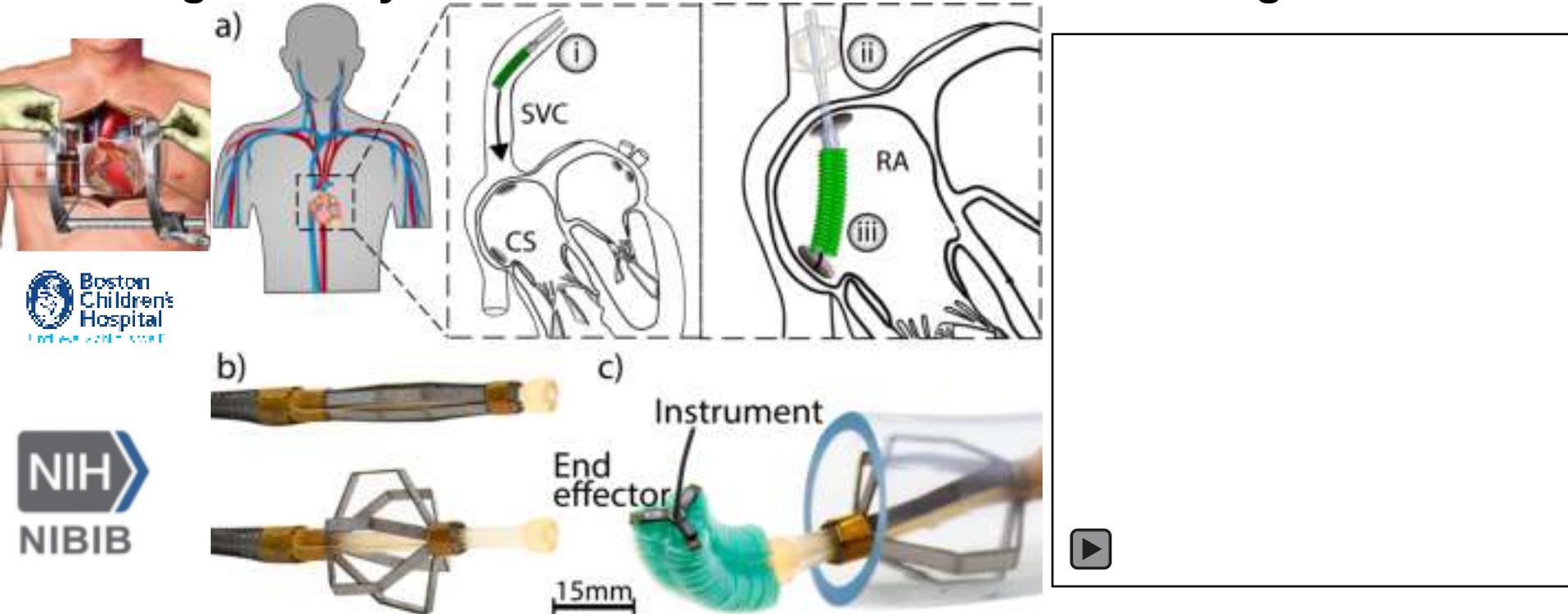
K. McDonald and T. Ranzani, "Hardware Methods for Onboard Control of Fluidically Actuated Soft Robots," *Front. Robot. AI*, vol. 8, Aug. 2021.

K. McDonald, A. Rendos, S. Woodman, K. A. Brown, and T. Ranzani, "Magnetorheological Fluid-Based Flow Control for Soft Robots," *Adv. Intell. Syst.*, p. 2000139, Sep. 2020.

Safe and effective manipulation of large abdominal organs



Restoring dexterity and force transmission inside the beating heart



Morphable Biorobotics lab research areas:

- Soft Robotics
- Bioinspired robotics
- Surgical robotics
- Wearable robotics
- Soft Robot Control
- Variable stiffening mechanisms
- Sensing and Actuation

Thanks!



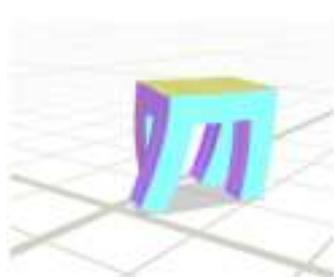
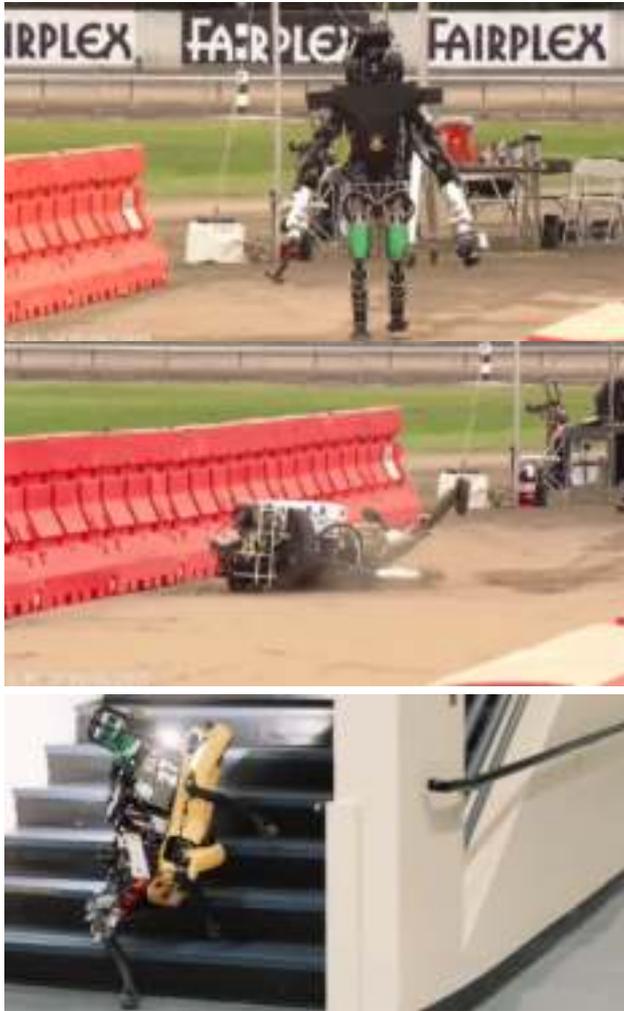
Controlling Soft Robots: Not as Hard as You'd Think

Andrew Sabelhaus

Assistant Professor
Mechanical Engineering, Systems Engineering
College of Engineering



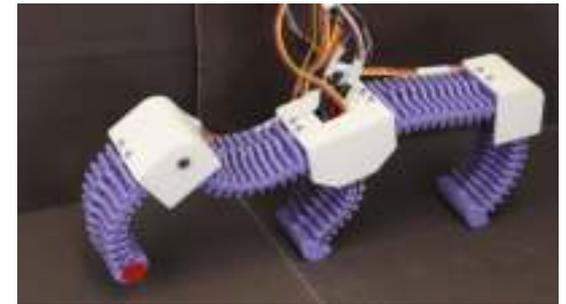
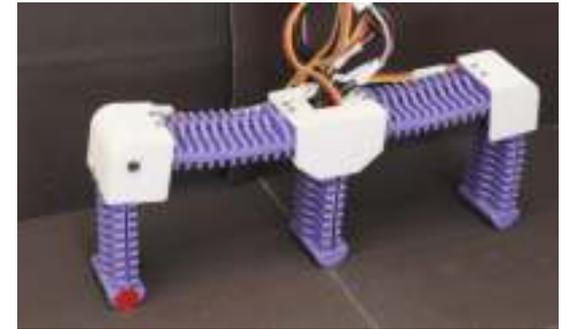
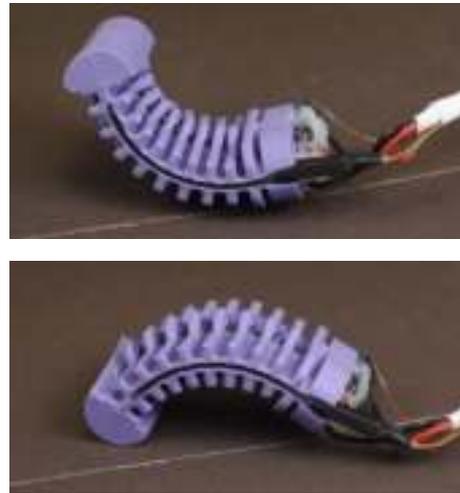
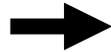
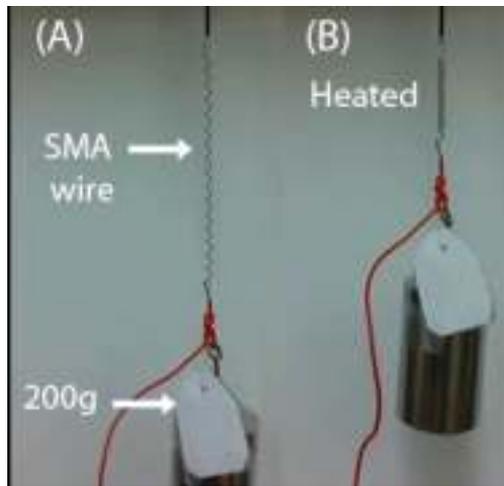
Different challenges for traditional robots vs. soft robots



➔ *Soft Robotics Control Lab*

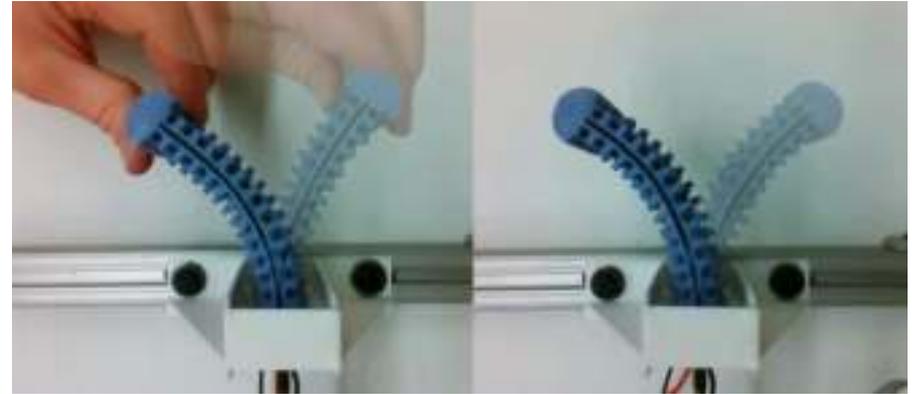
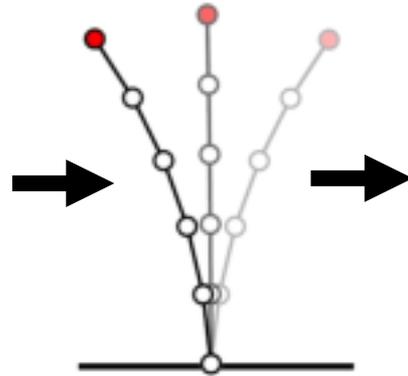
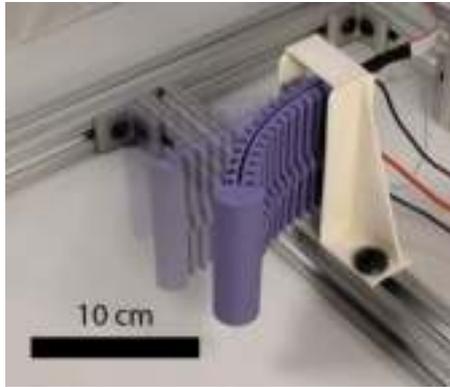
Soft robot control: work with, not against!

First, design for control (and simulation):
Shape Memory Alloy, Discrete Elastic Rods

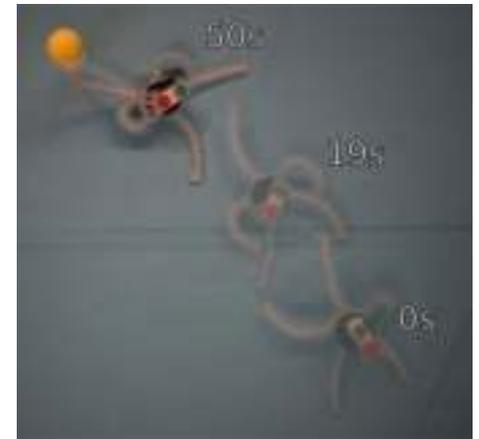
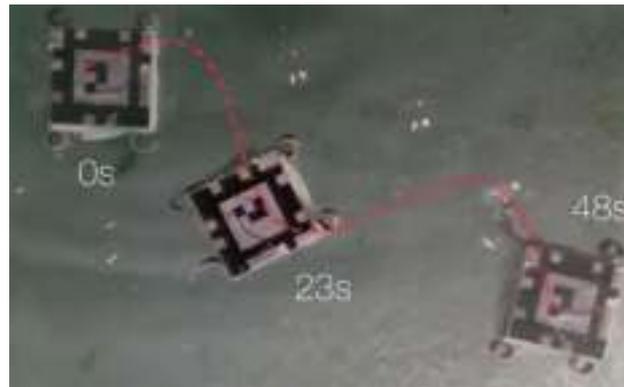
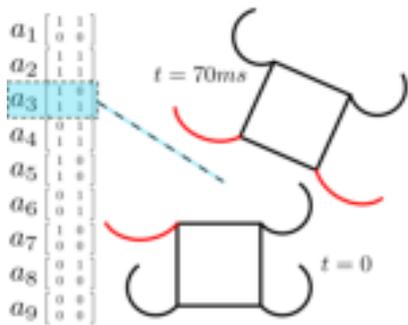


Then, for simpler tasks...

Approximation as a rigid robot, "Teach and Repeat"



Planning over precalculated actions



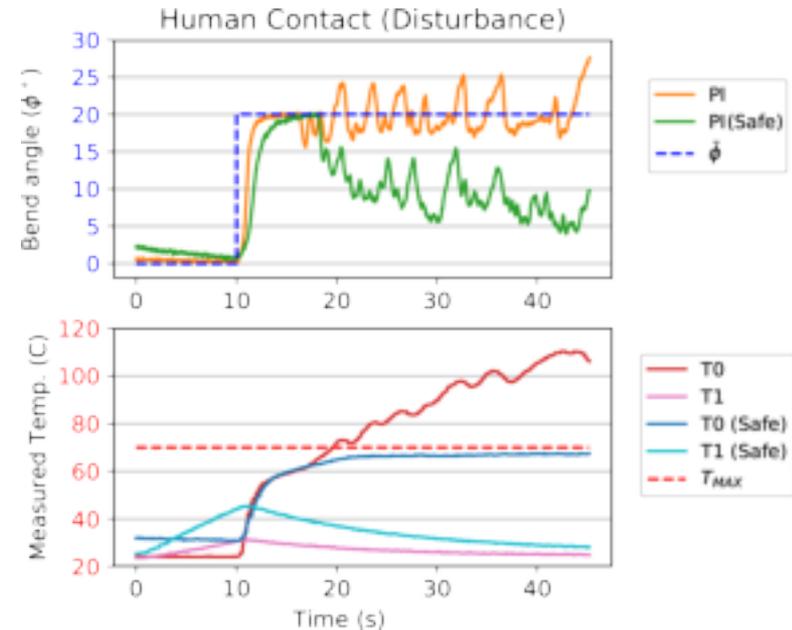
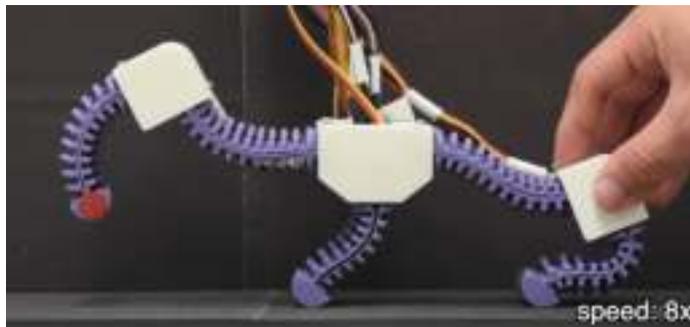
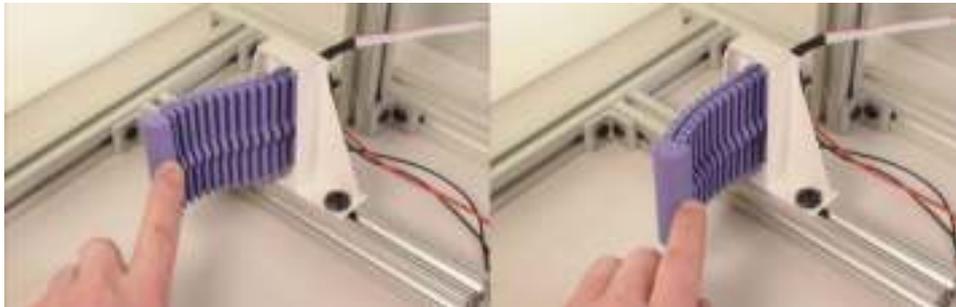
Boston University Office of Research

When the robot touches its surroundings...

Robustness to model uncertainty and disturbances



Verifiable safety with set invariance



Control for Sensing and Estimation

Sean Andersson

Professor
Mechanical Engineering
Systems Engineering
College of Engineering

biophysics

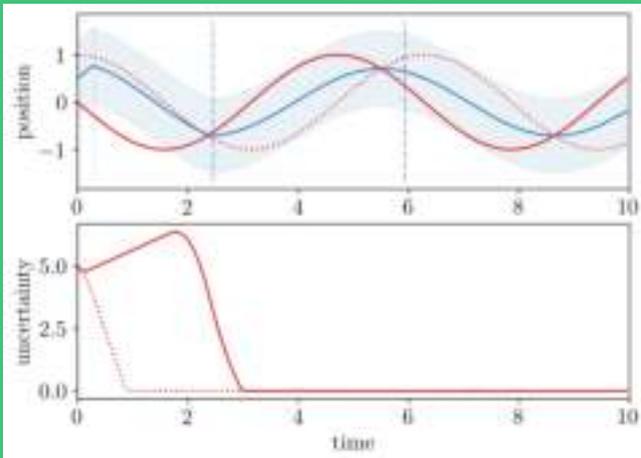
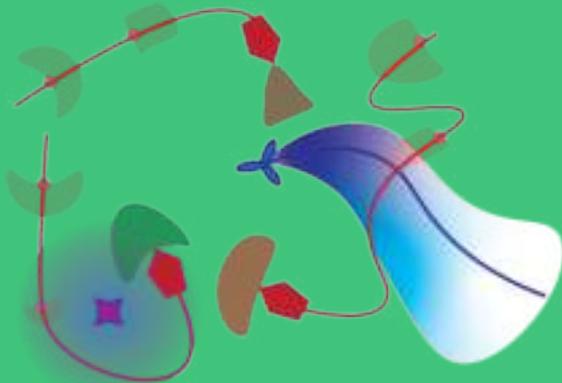
multi-agent
systems

control for sensing
and estimation

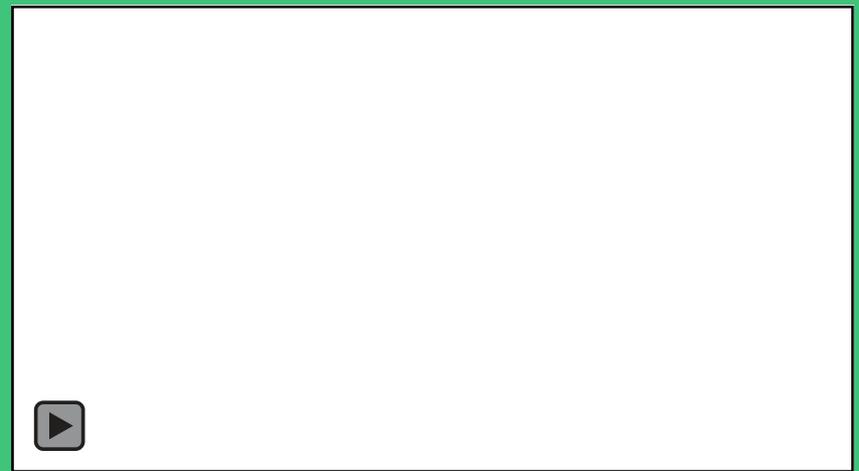
motion planning
and exploration

Multi-agent systems

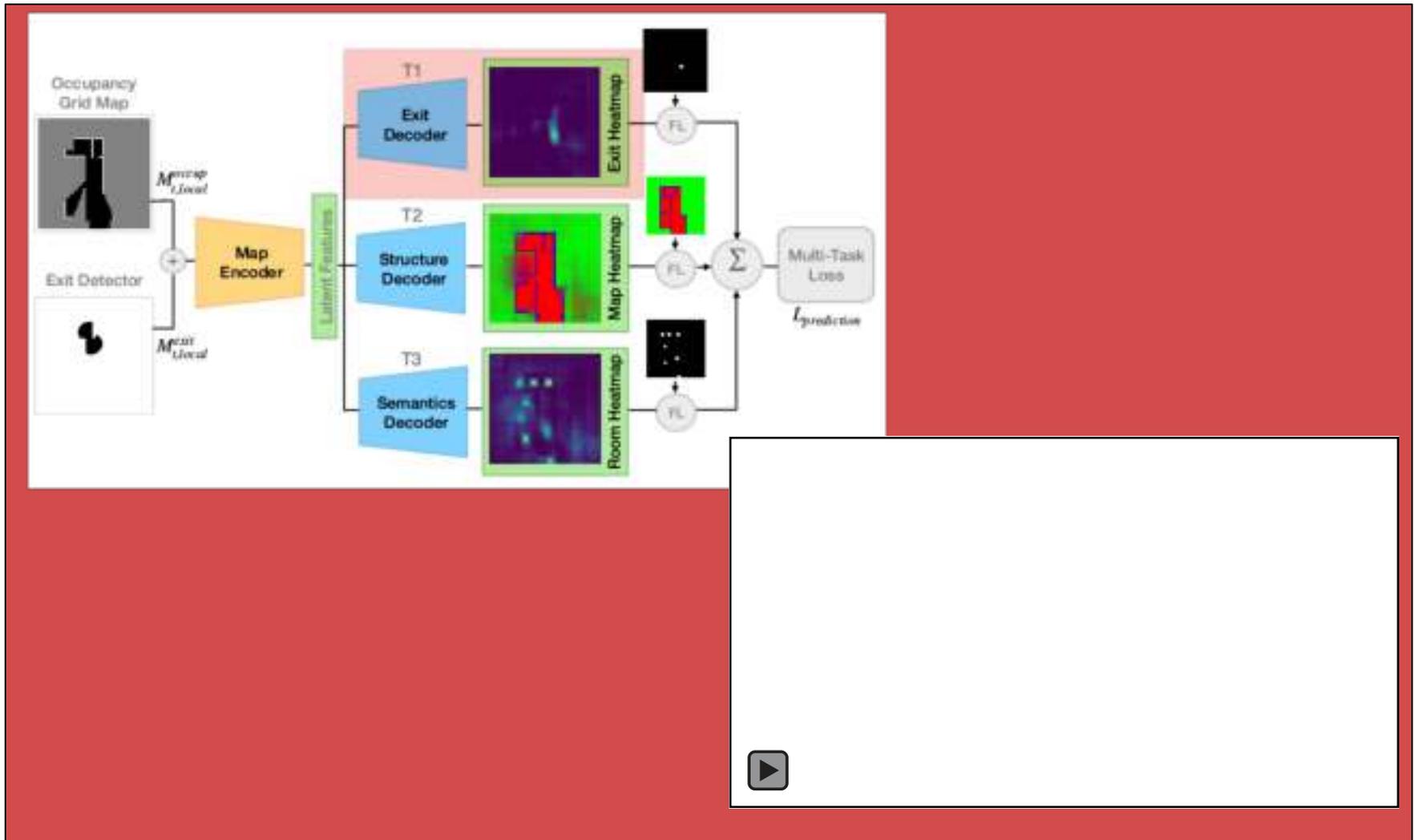
Persistent monitoring



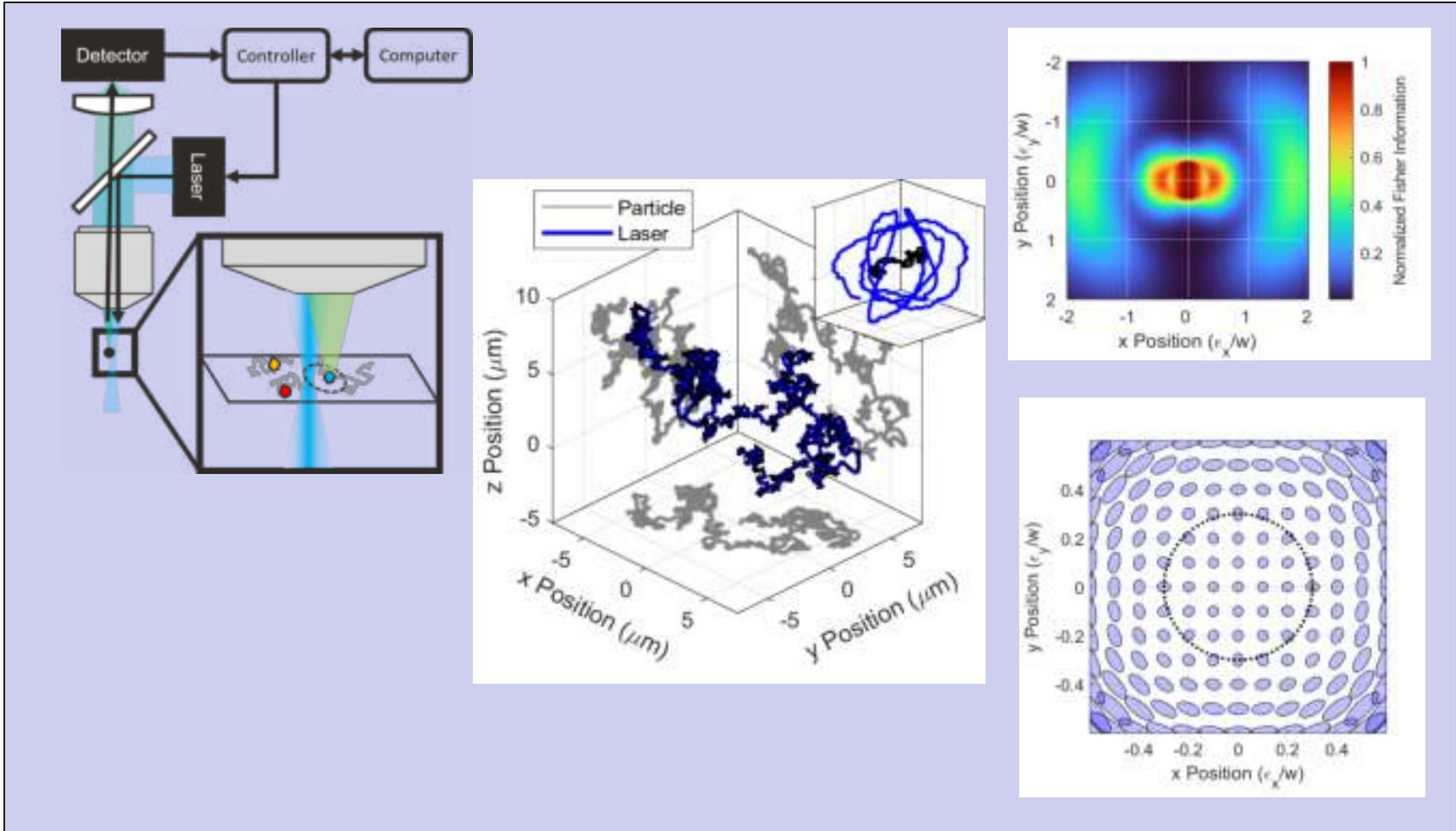
Data harvesting



Motion planning and exploration



Biophysics



THANK YOU!



UPCOMING EVENTS

Learn more & RSVP: bu.edu/research/events
Topic ideas & feedback: bu.edu/research/topic-ideas

RESEARCH ON TAP

China and the World
February 27, 2023 | 4-6 pm

Safety, Justice, and Health in US
Cities
March 15, 2023 | 4-6 pm

RESEARCH HOW-TO

Learn to Use the Dimensions Database
February 15, 2023 | 1-2:30 pm

Guide to Op-Eds: How to Improve your
Writing, Editing, and Pitching
February 16, 2023 | 3-4:30 pm

