

LABORATORY FOR INFORMATION & DECISION SYSTEMS

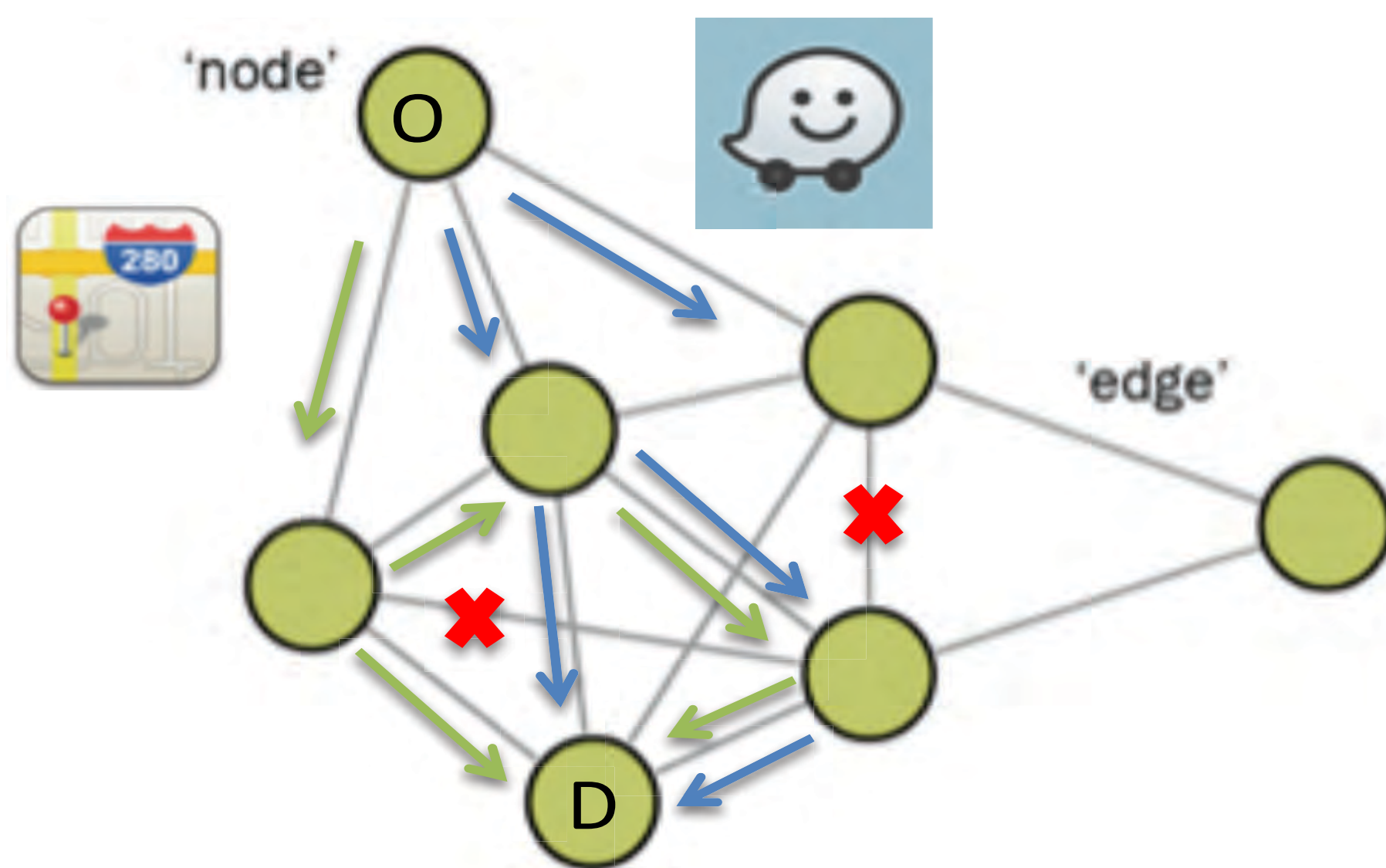
# LIDS Research Groups

2021-2022

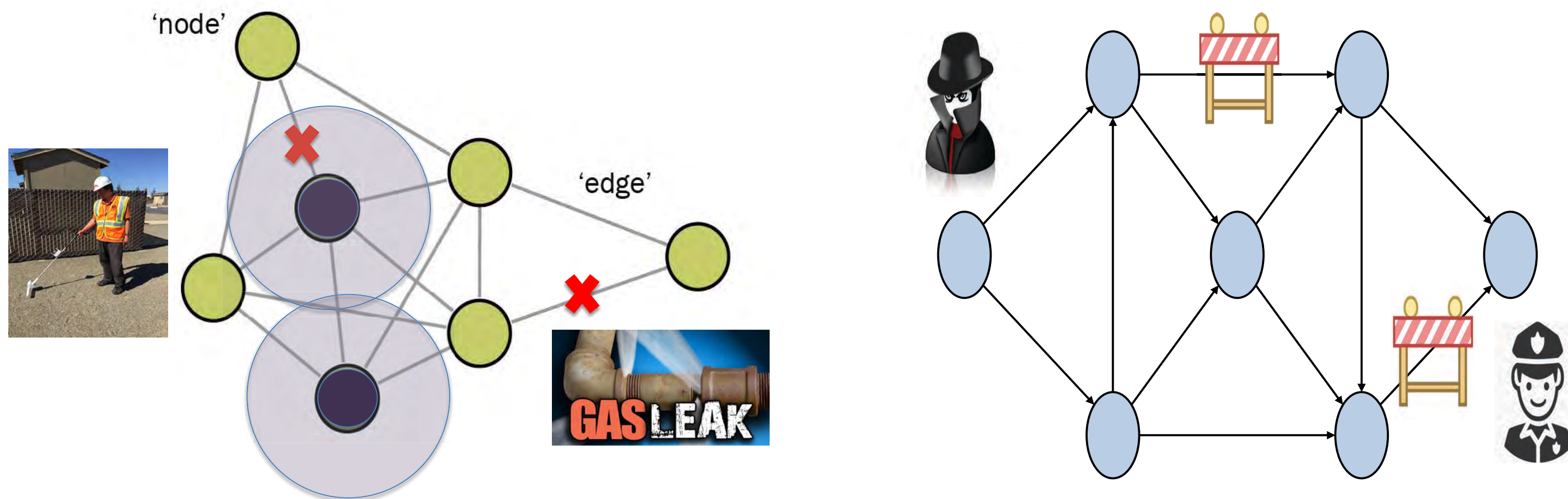


- **Issues:** Network Resilience, Transportation, Disaster Response, Environmental Sustainability
- **Tools:** Stochastic Control, Game Theory, Theory of Incentives, Optimization in Networks
- **Solutions:** Information Systems, Monitoring and Control Strategies, Incentive Mechanisms

*Traffic routing, incentives, and information provision during disruptions*

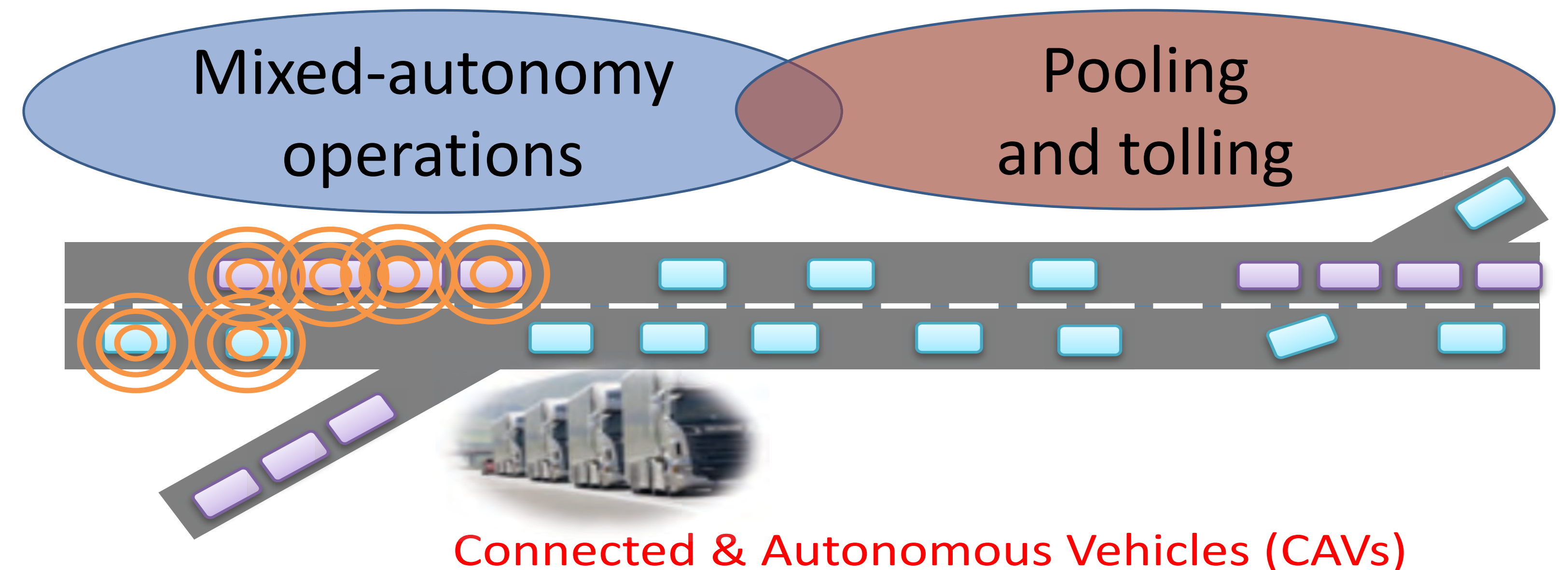


*Optimal allocation of flexible resources to improve resilience to disruptions*

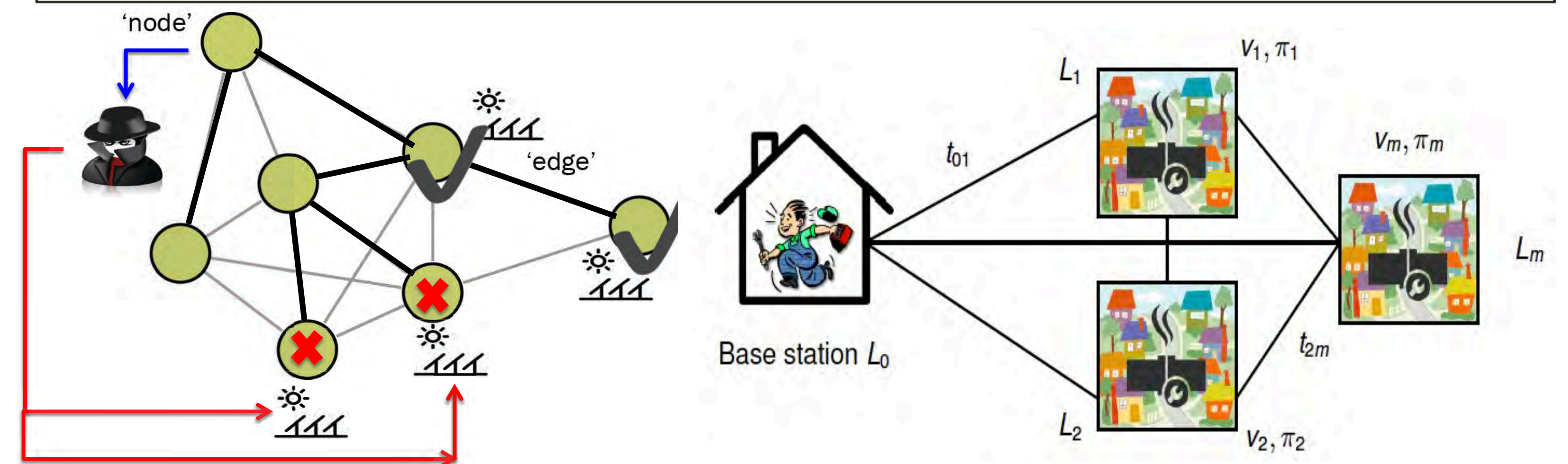


*Strategic network interdiction to prevent routing of illegal or bad traffic*

*Modeling and operations of mixed-autonomy transportation systems*



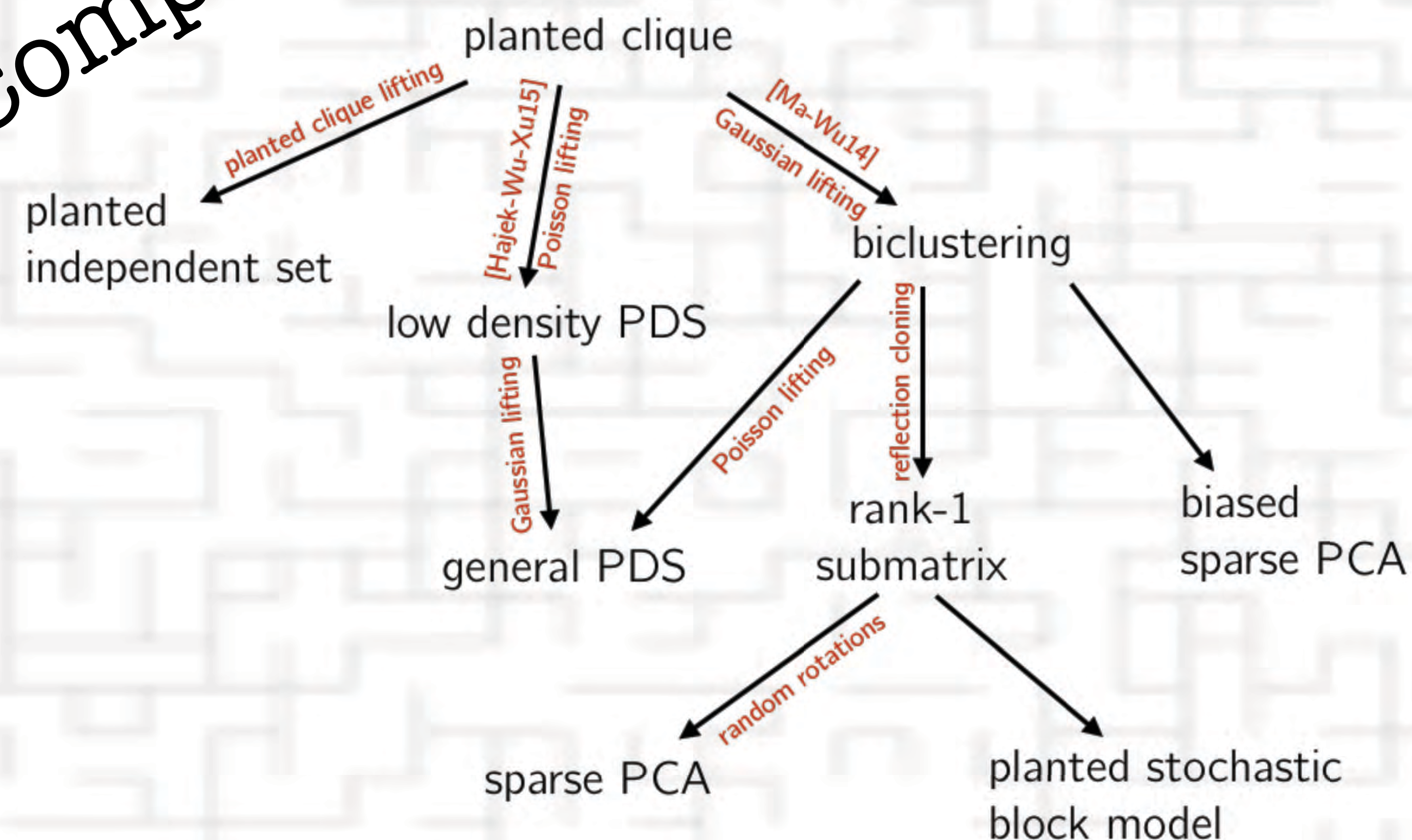
*Using flexibility of electricity grid to improve resilience to faults/attacks*



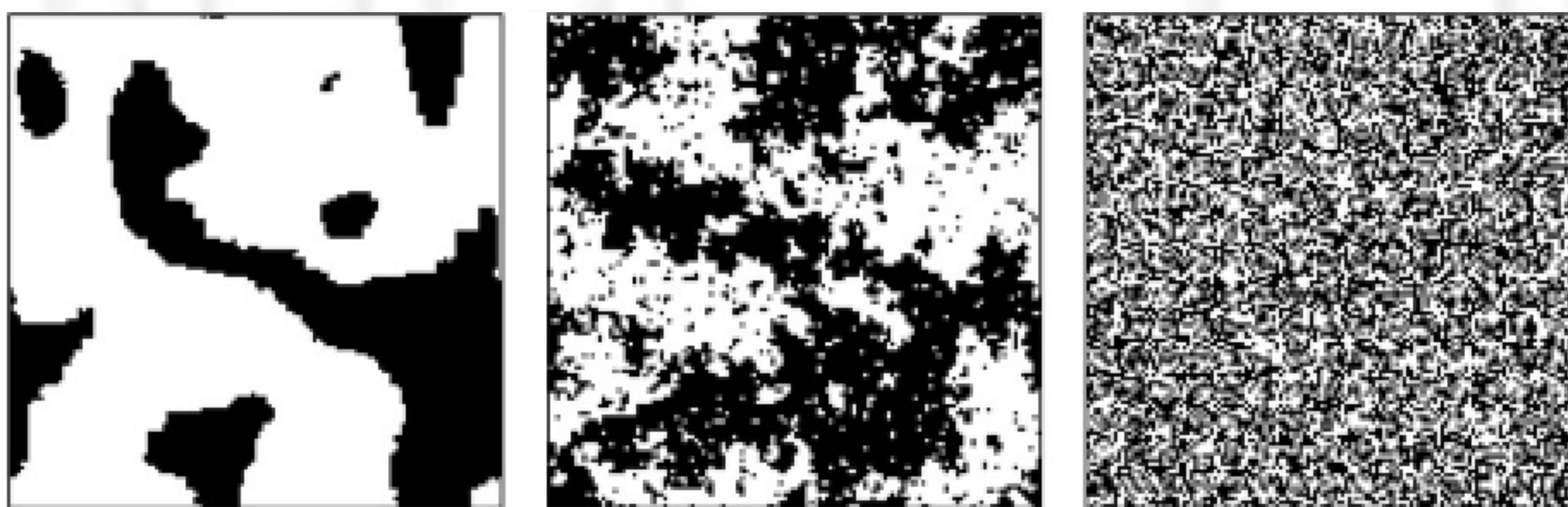
*Crew scheduling under diagnostic uncertainty after a natural disaster*



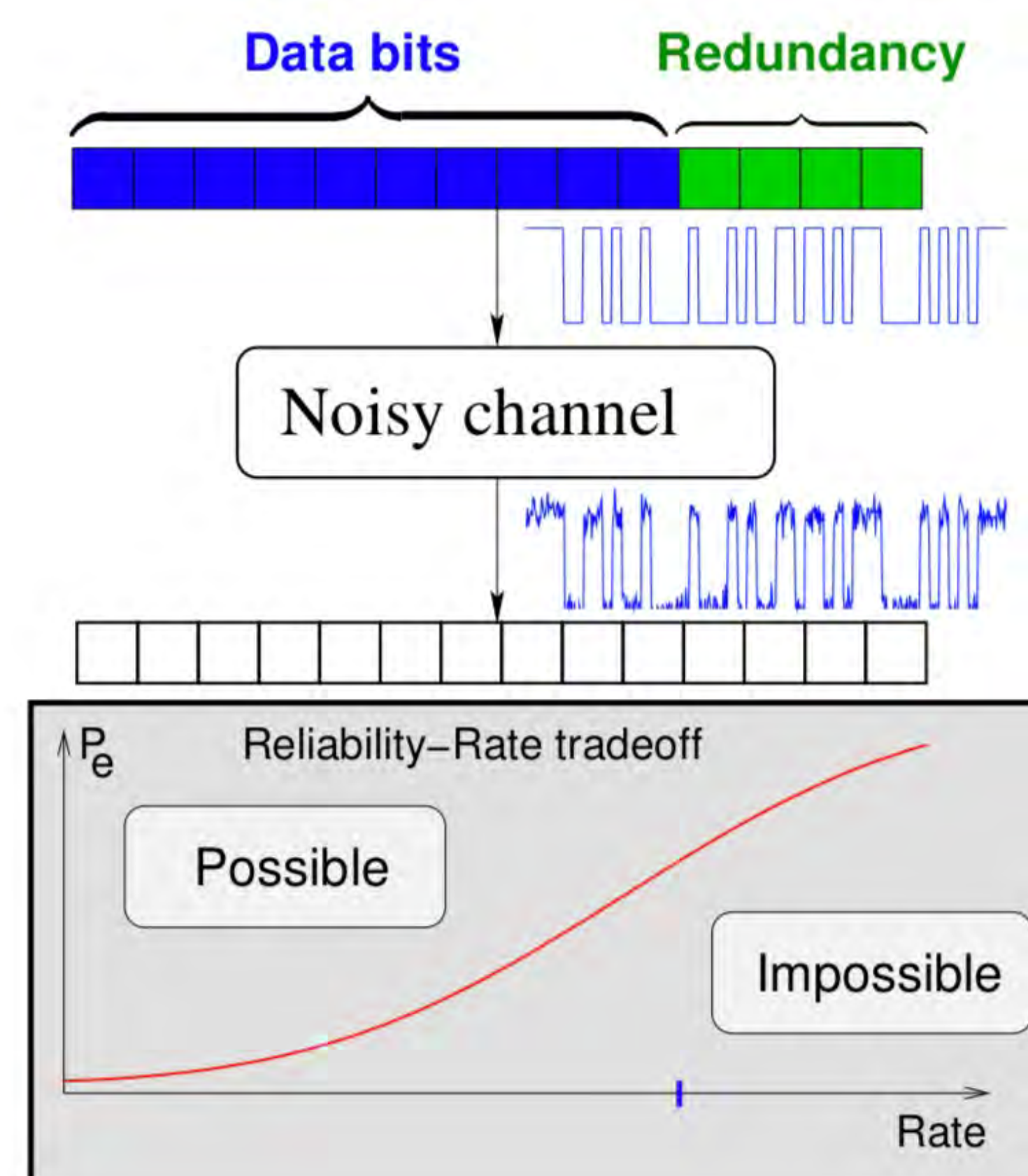
Average-Case  
Comp. Complexity



Information Theory &  
Statistical Inference



Probability



Digital  
Communication



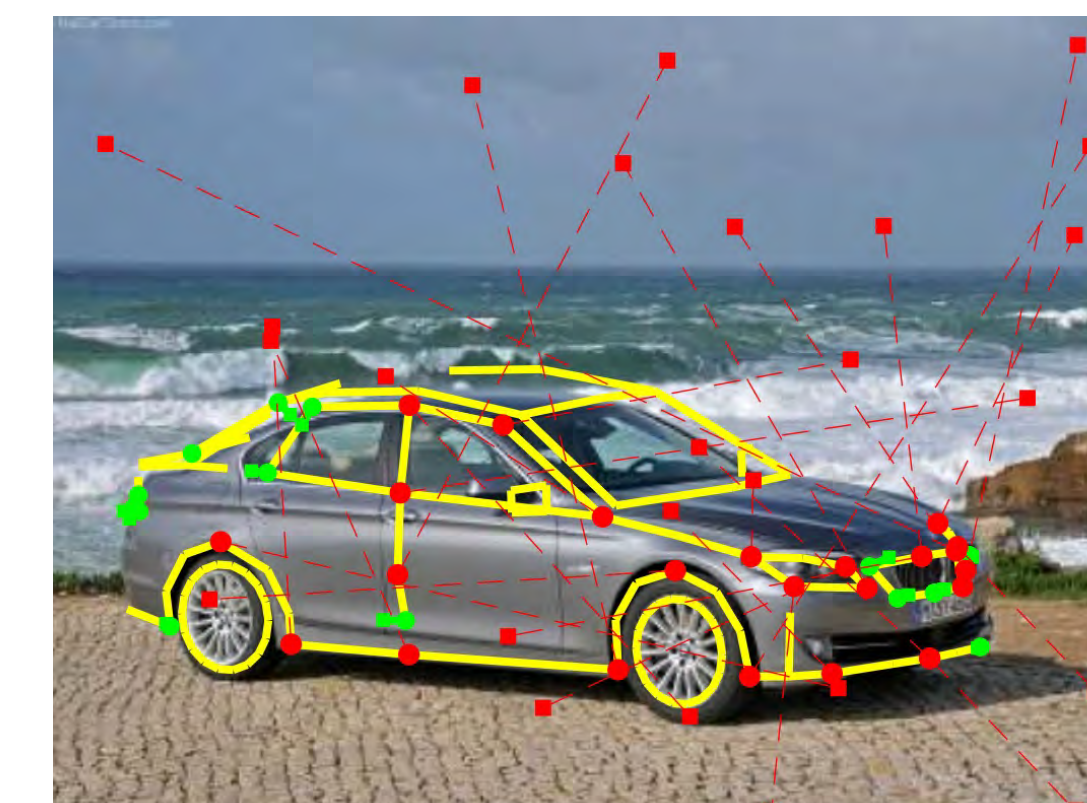
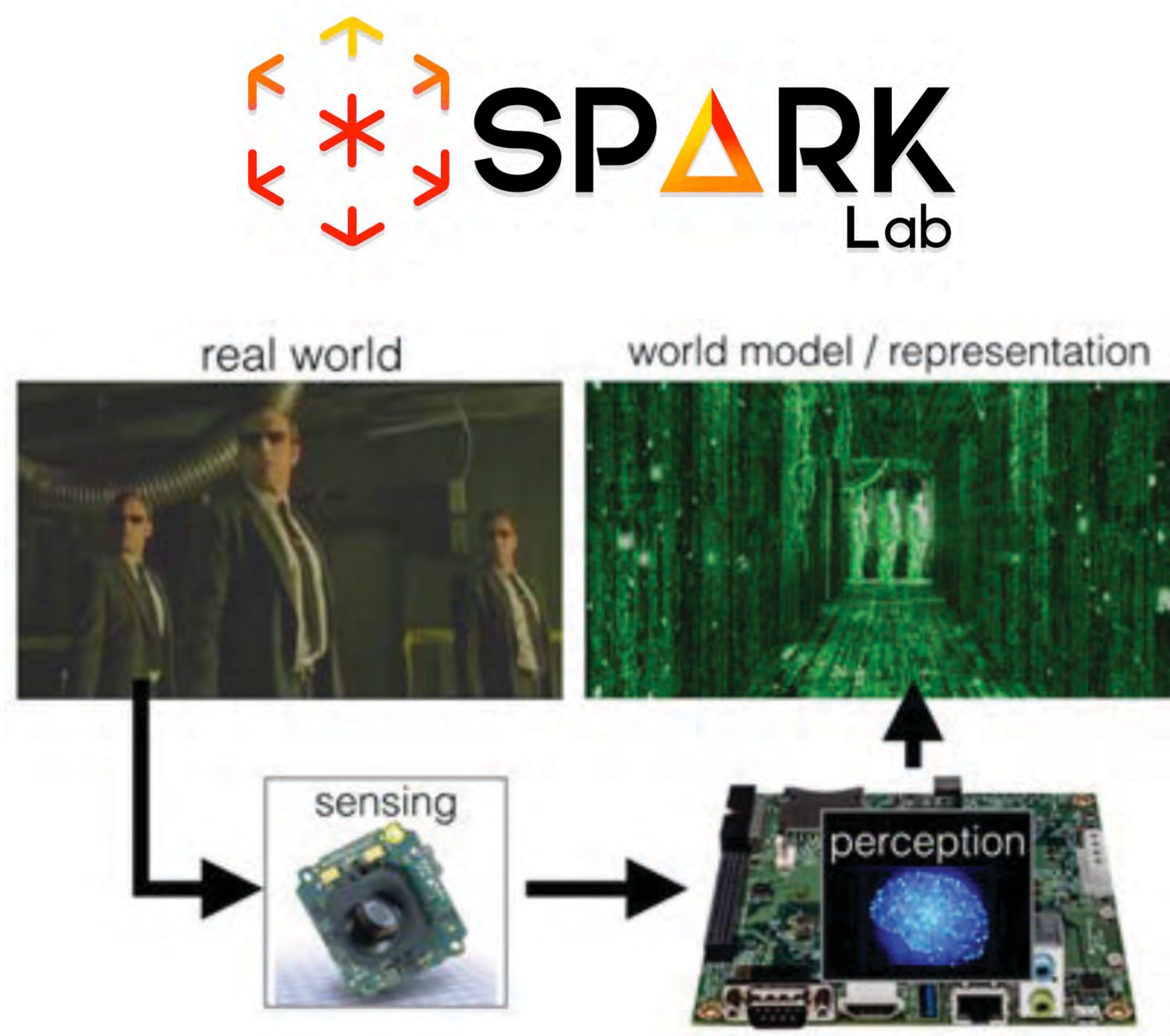
- **My group asks not just what we know, but also: how well do we know it?**
- We study uncertainty and robustness -- and design fast, easy-to-use, and provably accurate decision-making tools.

## Some examples:

- How many new variants can scientists expect to find when sequencing new genomes? We provide a state-of-the-art estimate, calibrated uncertainties, and an optimal tradeoff (under a fixed budget) of quantity (# individuals) and quality (sequencing depth).
- Consider an existing famous microcredit data analysis with >16,500 data points. Our work shows that if you drop one data point, the sign of the result changes, and if you drop 15 data points, you can get a significant result of the opposite sign. In general, we provide a tool (and supporting theory) to very quickly discover: if you drop a very small fraction of your data, how much can your substantive conclusions change?
- We develop a method to enable individuals with severe motor impairments (cerebral palsy, locked-in syndrome) to type, draw, game, and generally use computers. We adapt to individual users and limited motor control using statistical inference.

We **collaborate** with: economists, biologists, materials scientists, HCI specialists, and more. Our **methodology and theory** draw on measure-theoretic probability, stochastic process theory, real analysis, optimization, statistical mechanics, and a lot of other fun math.



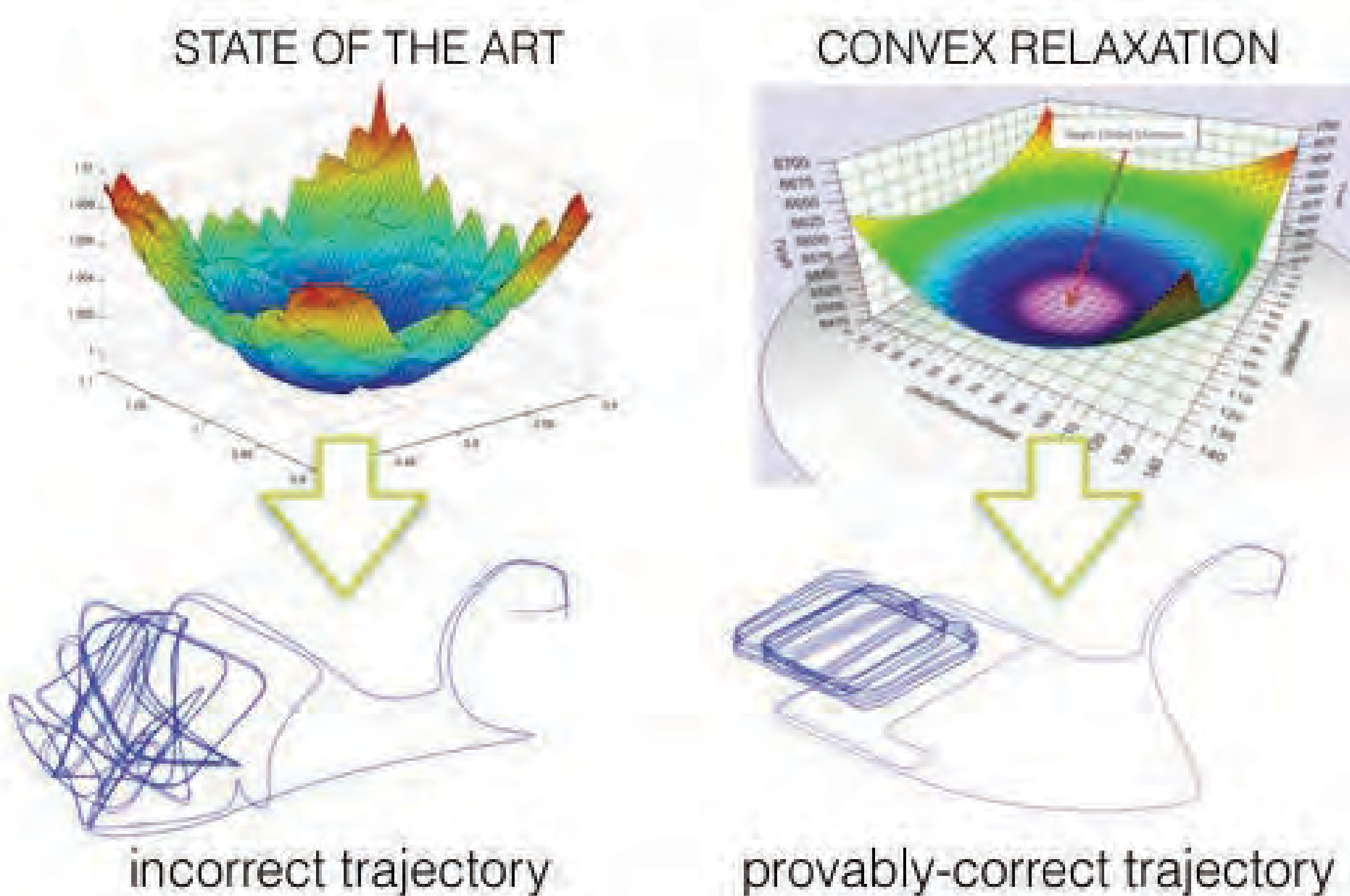


**Goal:** to develop theoretical understanding and practical algorithms to bridge the gap between human and computational (robot) perception

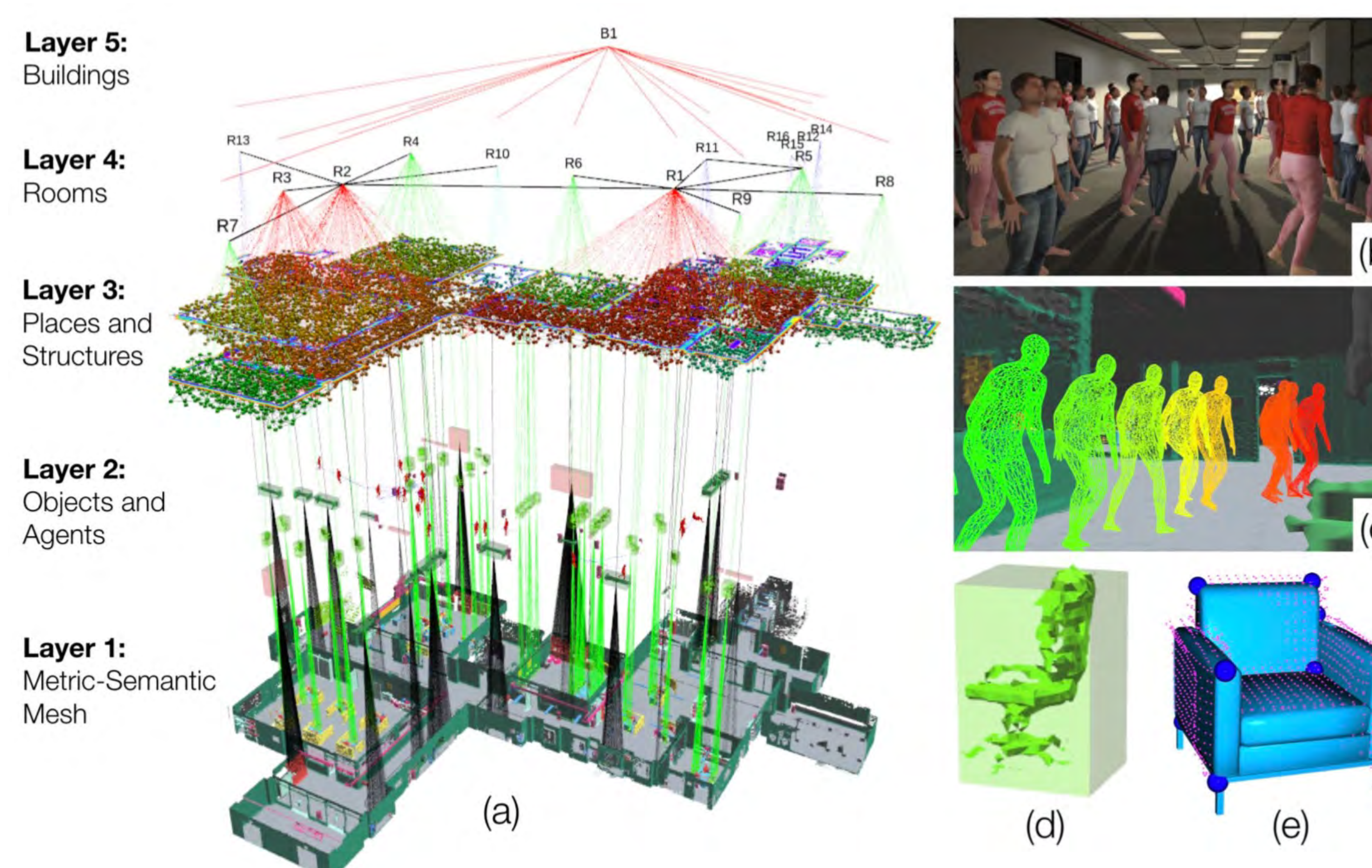
**Technical tools:**

- (non-convex, distributed) optimization
- nonlinear estimation & probabilistic inference
- geometry, graph theory
- control theory, machine learning

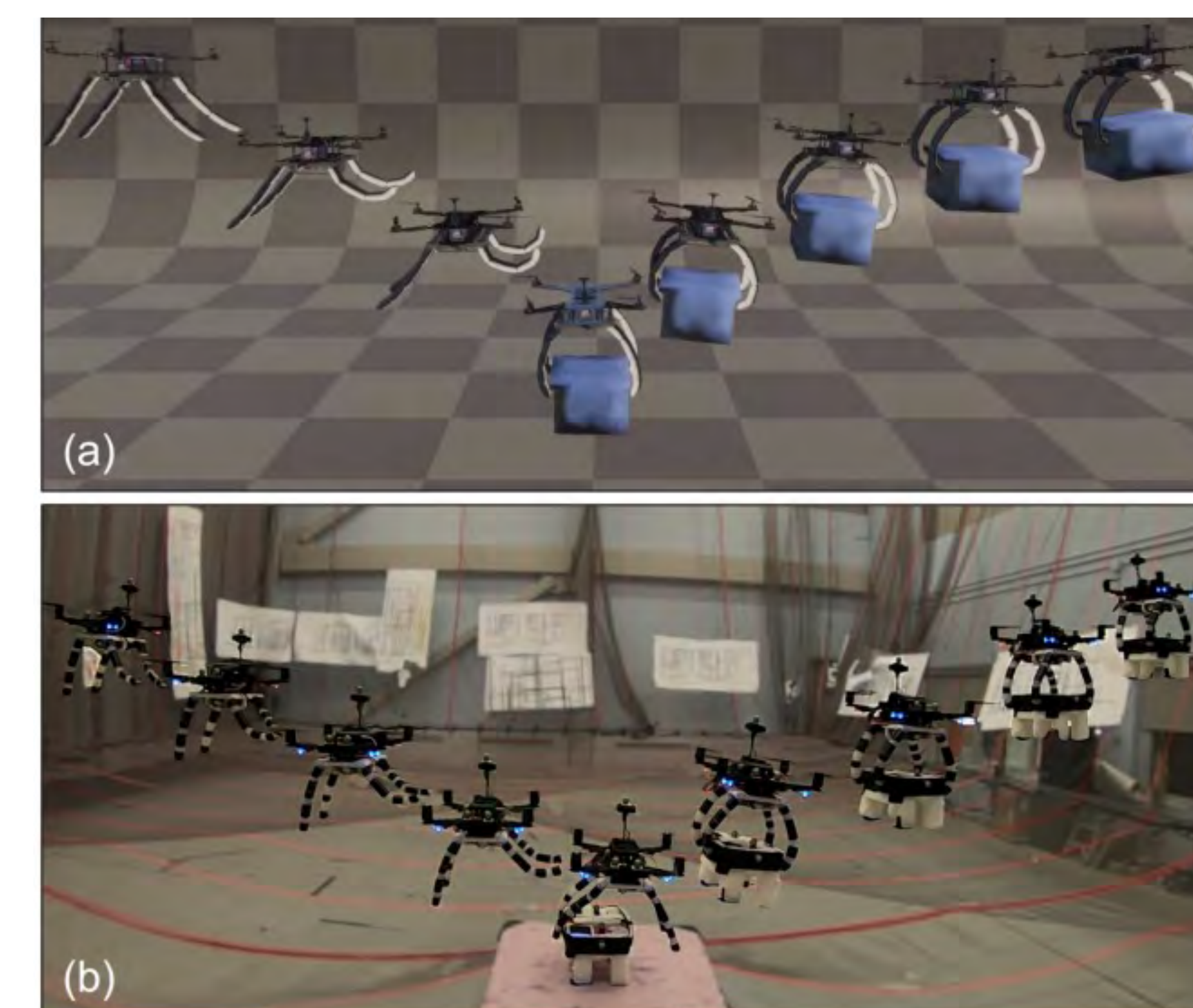
## Certifiable Robustness



## Real-time High-level Understanding



## Robot Co-Design





|  | MOTIVATIONS  | RESEARCH QUESTIONS  | FINDINGS   |
|--|--|---|--|
| <b>ENERGY</b><br>Markets for Energy Storage  | The power sector is in the cusp of a revolution due to increasing <b>renewable energy penetration</b> and <b>transportation electrification</b> , necessitating a complete rethinking of electricity market design.  | The future grid will consist of millions of EVs that can double as energy storage resources. How to design efficient and incentive compatible mechanisms for EVs to sell battery service to the ISO?  | Without carefully-designed incentive structures, integrating EVs for energy storage is counterproductive to energy-efficiency of the grid. Mechanisms to solve this issue have been devised.   |
| <b>FINANCE</b><br>Systemic Risk in Financial Networks  | <b>Financial networks</b> are sensitive to <b>shocks</b> . Interbank lending networks are crucial to <b>allocating liquidity</b> . <b>Default cascades</b> can be detrimental to national economies.   | How many <b>independent shocks</b> can hit the network?<br><br>How does <b>interbank lending network</b> function in times of market stress?  | The effect of the network structure on the default rate and systemic loss.<br><br>A method for real-time, automatic, interpretable risk assessment.  |
| <b>DIGITAL FARMING</b><br>Information Elicitation and ML to find creditworthy borrowers<br>Reinforcement Learning for Customized Farming | Community members know which of their neighbors are likely to repay a loan. We can elicit this information using clever incentives and algorithms.<br><br>Large-scale data-driven farming is hard as each farm is a <b>time-variant system</b> , and <b>observations are sparse</b> with respect to interventions and farms. | How to develop incentives which are maximized with truthful reporting? How to create robustness to collusion? How to improve with online learning?<br><br>How do we learn <b>near-optimal customized policies</b> for a large number of farms while achieving <b>provably good performance</b> ?                            | We designed truncated decision scoring rules which incentivize truthfulness in most cases. We will learn more from a pending deployment in Uganda.<br><br>Given a set of policies, we can learn in finite time and perform almost as well as the best policy considered.                                     |
| <b>COVID-19</b><br>Testing As Control<br>Impacts of Interventions  | Attempts to control the spread of the COVID-19 epidemic focus on social distancing, but <b>testing and contact tracing</b> should also be considered.<br><br>Interventions for COVID-19 affect people differently due to <b>variations in age, health conditions, socioeconomic status</b> , and many other factors.         | How do we <b>model testing</b> /contact tracing/network structure? What are the <b>qualitative relationships</b> between testing and disease spread?<br>What are the <b>impacts</b> of various interventions on different <b>communities</b> ? Are there any <b>trade-offs</b> ? Which interventions are <b>effective</b> ? | Dynamics are <b>independent of network structure</b> and simple relationships/formulas determine how testing and disease spread interact.<br><br>There is a trade-off between saving lives from the pandemic and from recession. The disadvantaged community tends to suffer significantly more than others. |
| <b>NETWORKS</b><br>A Marketplace for Data  | Data, an increasingly vital asset, needs to be valued in a systematic way.<br><br><b>Data markets</b> must consider interactions between and among data buyers, sellers, and intermediaries.   | <b>Robust real-time matching</b> mechanism to buy and sell training data for Machine Learning tasks?<br><br>How to allocate and price data sets to buyers in <b>competition</b> with each other?  | Mathematical model and real time algorithms for a two-sided data market.<br><br>Welfare and revenue-maximizing mechanisms for selling data to data buyers with negative externalities.   |



**Multiagent**

**Planning**

**Learning**

**Perception**

### **Tools:**

Control Theory  
Optimization Theory  
Algorithms  
Graph Theory  
Machine Learning

### **Venues:**

AI/ML: NIPS, ICML, ...  
Control: CDC, ACC, ...  
Robotics: RSS, ICRA, ...

### **Projects:**

- ☐ Cooperative Multiagent Reinforcement Learning
- ☐ Lifelong Learning for Distributed Intelligence
- ☐ Pedestrian Motion Prediction
- ☐ Decentralized Dynamic Task Allocation
- ☐ Multiagent Search & Rescue in Forests
- ☐ Resource-aware Spatial Perception
- ☐ Active Perception for Threat Identification



# Energy and Power Systems

## Marija Ilic & Audun Botterud

Electrical  
Energy  
Systems  
Group at  
MIT

### Research Goals

- Formulate, model and simulate electric energy systems as complex dynamical systems
- Design cyber systems for enabling their performance (SCADA, markets, control, optimization)
- Develop novel analytics for future low-carbon electricity markets with high shares of renewable energy

Energy  
Analytics  
Group

### Systems Tools

Modeling of  
complex systems

Optimization and  
control methods

Numerical and  
simulation methods

Network systems

Mathematical  
programming

Distributed interactive  
systems

### Current research areas

Microgrids (terrestrial,  
future aircrafts)

Cyber-secure energy  
systems

Social-ecological  
energy systems

Scalable power system  
simulators

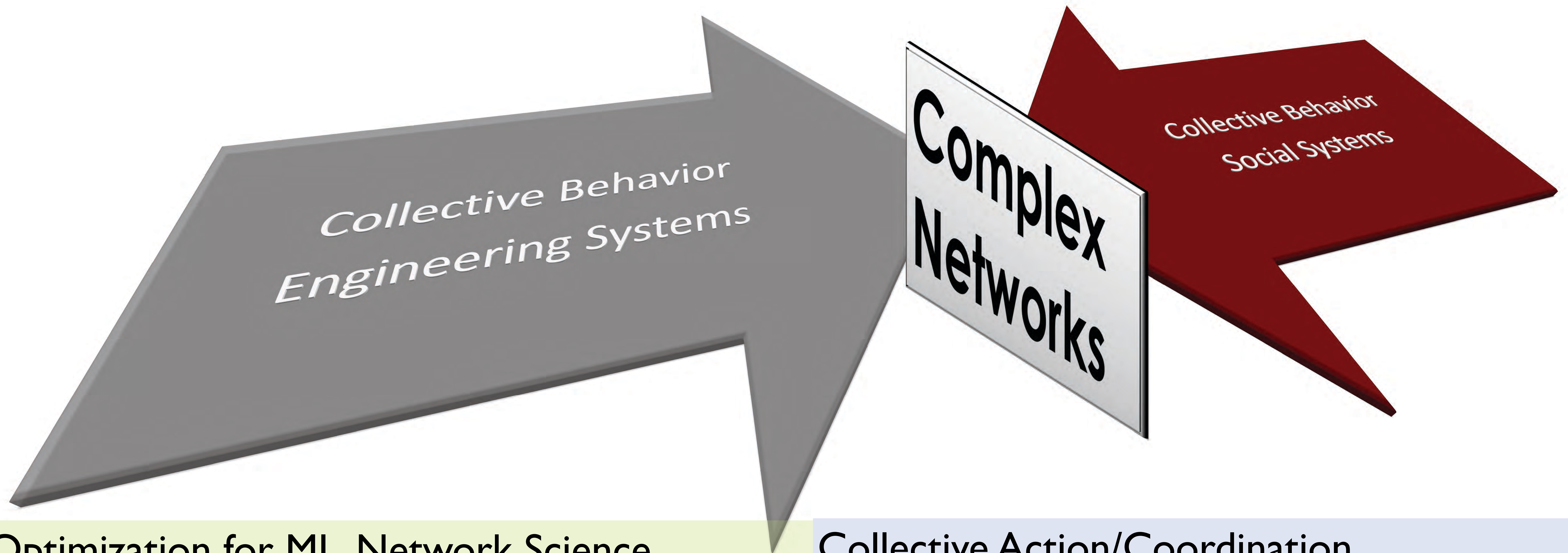
Energy decision  
analytics

Electricity markets

Grid integration of  
renewable energy

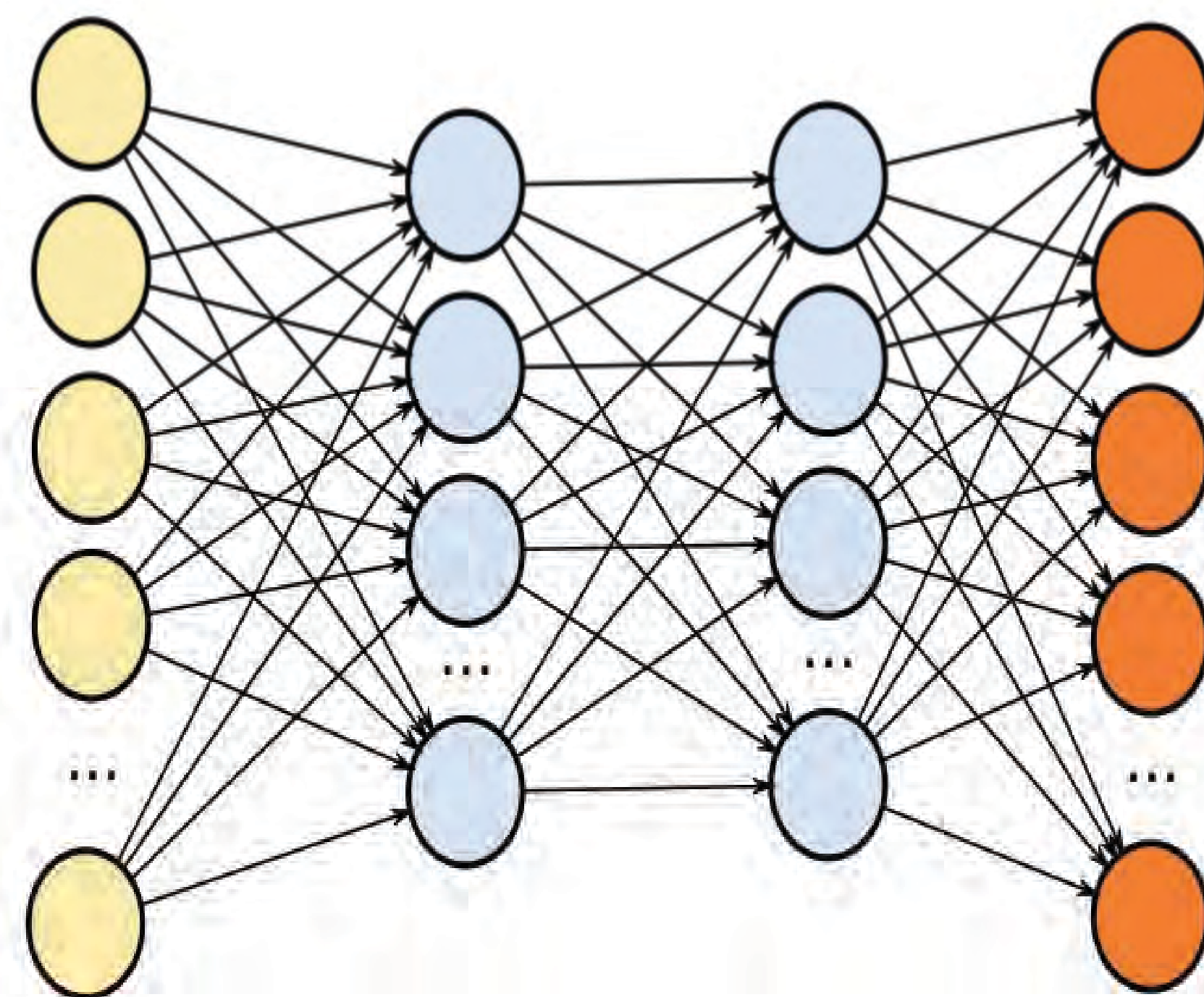
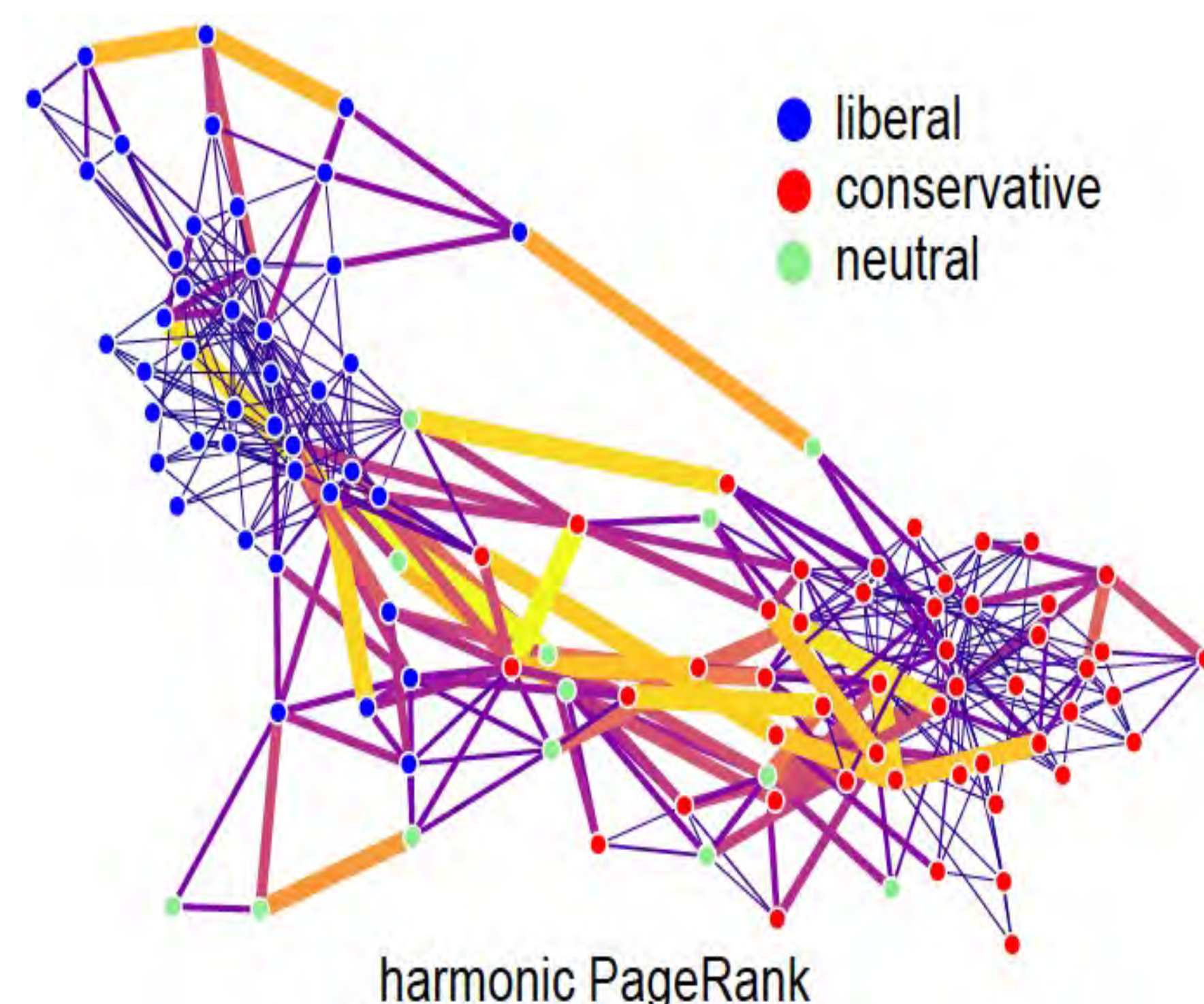
Energy storage and  
distributed energy





Optimization for ML, Network Science,  
Cooperative Control and Robotics, Sensor &  
Actuator Selection,  
Distributed Estimation

Collective Action/Coordination  
Social Learning, Group Decision Theory,  
Networks Economics,  
Computational Social Science



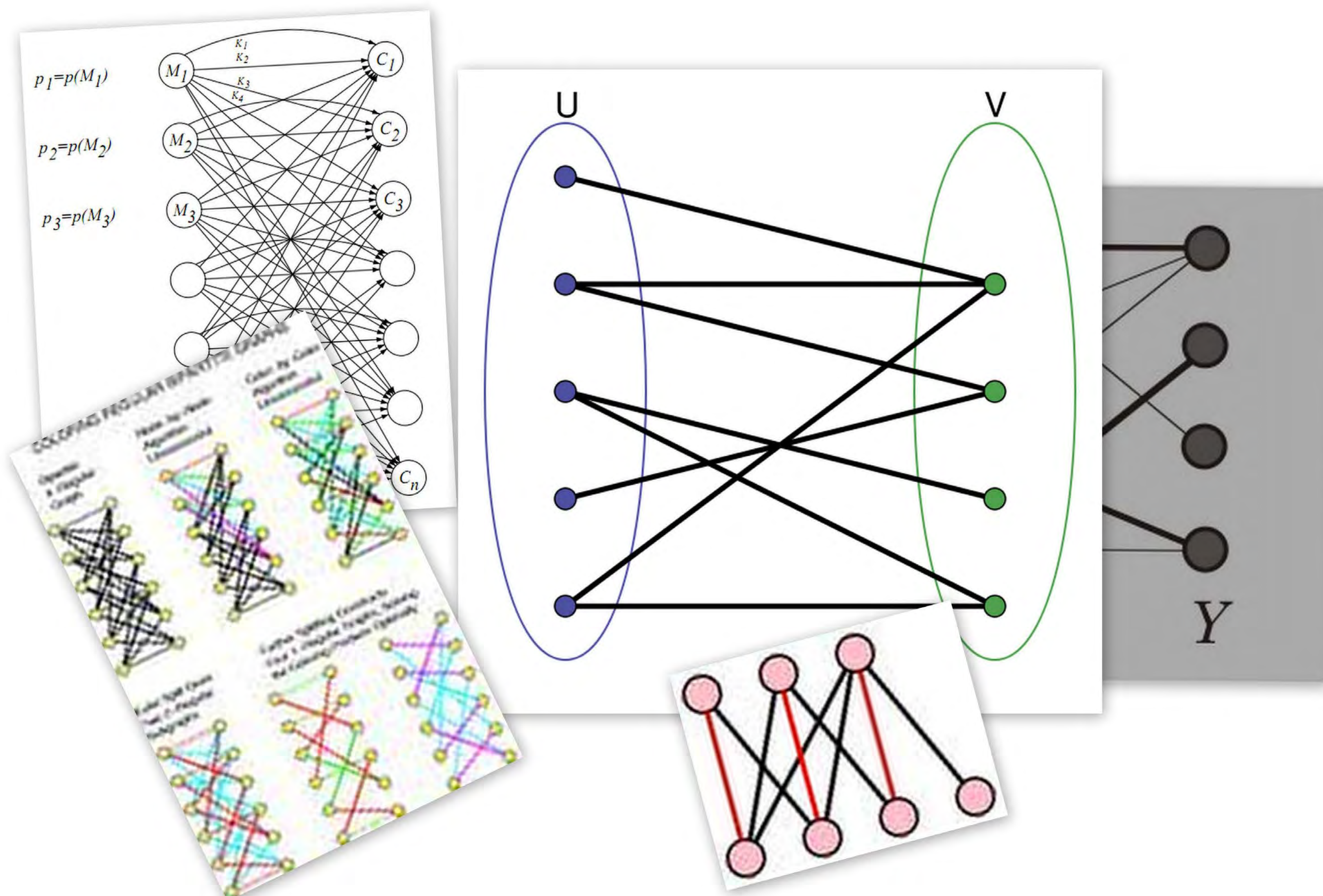


**research:** online optimization and learning problems; applied probability

**focus:** theory, models, algorithms

**applications, contexts:**

- routing, mobility, spatial explorations
- internet, dynamic resource allocations
- cyberinfrastructure security
- sharing economy
- networks





# Sertac Karaman



How fast can birds fly through forests? How quickly can robots navigate in cluttered environments? We analyze the performance limits for robotic vehicles operating in cluttered environments.

As driverless cars edge closer to becoming a reality, we ask the question: Can autonomous cars substantially improve performance in traffic intersections? How about all-autonomous transportation networks?

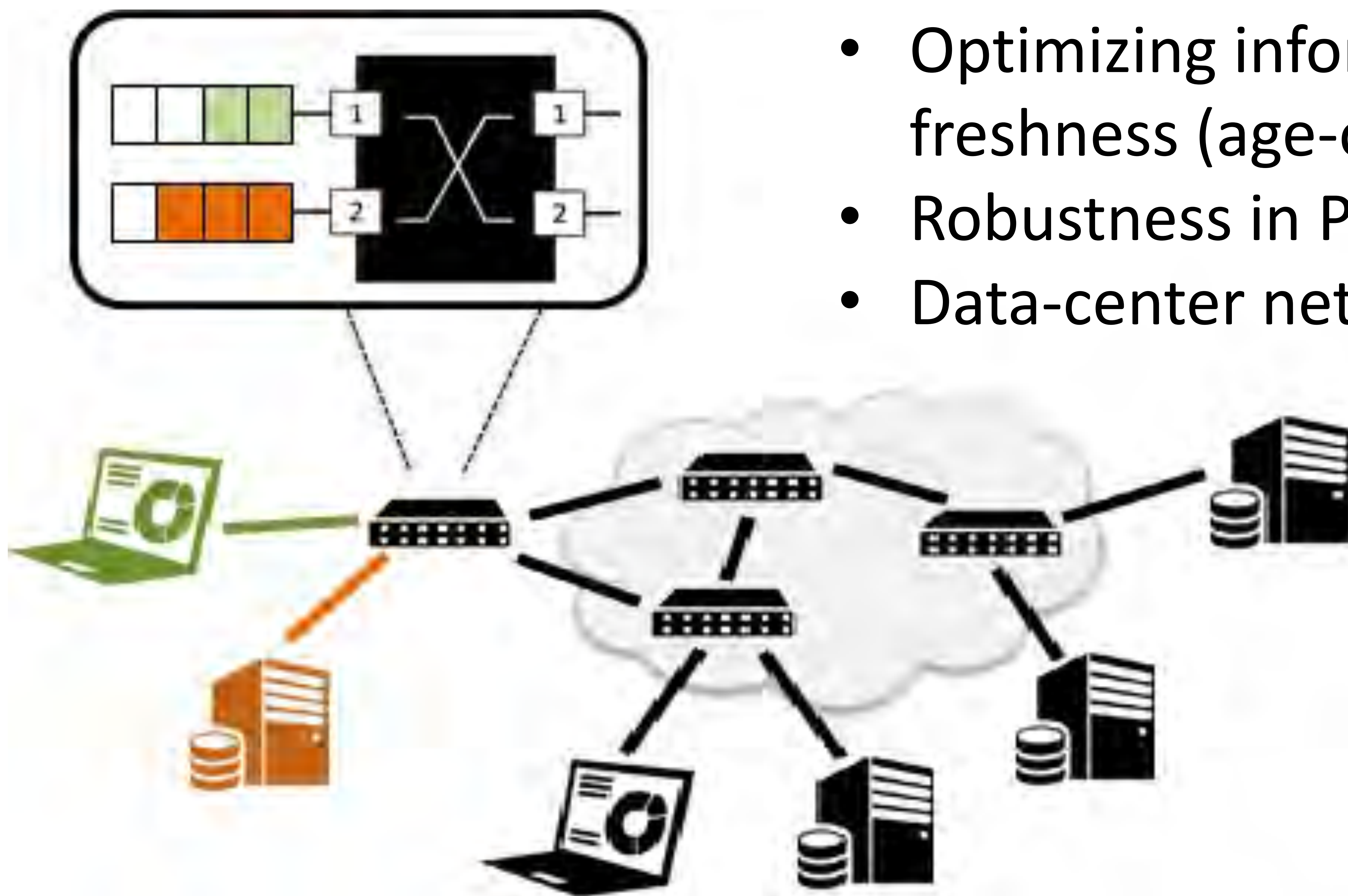


A new approach to teaching feedback control systems allows the students to instantly test their control design on a palm-size drone in the comfort of their room. Each student enrolled in 16.30 will get a Parrot mini drone.



We develop architectures and algorithms for communication networks, including:

- Wireless networks
- Machine learning in networks
- Autonomous network control
- Communication for UAVs
- Optimizing information freshness (age-of-information)
- Robustness in Power grids
- Data-center networks





**Research Focus:** Developing **new models, mathematical tools, and algorithms** for the analysis and optimization of technological, social, economic, financial networks and **for processing large-scale data.**

**Key Tools:**

Economic  
Theory

Game  
Theory

Optimization  
Theory & Algorithms

Network  
Theory

**Current Projects:**

Bayesian Learning from Reviews

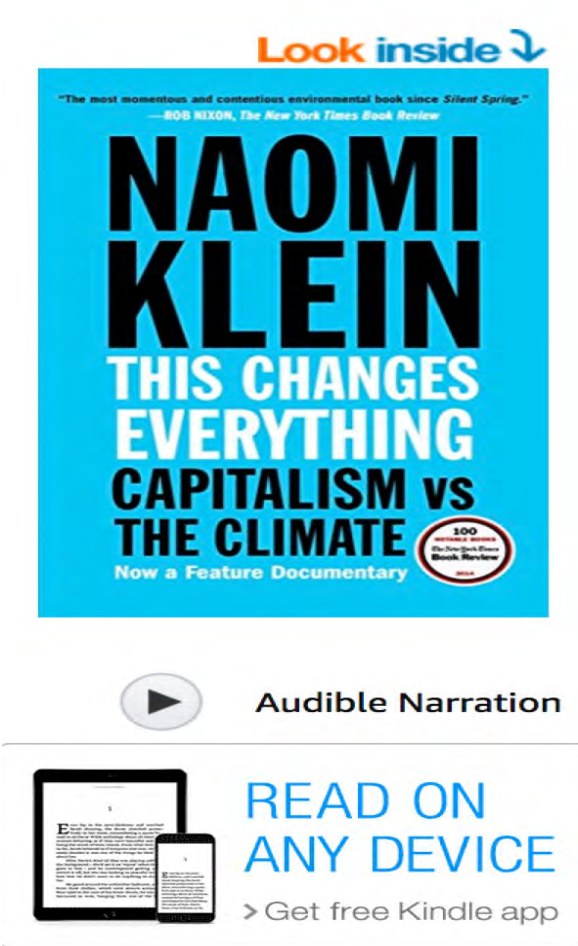
Optimization for Machine Learning

Systemic Risk in Financial Networks

Network Aggregative Games

Information and Learning in Traffic Networks

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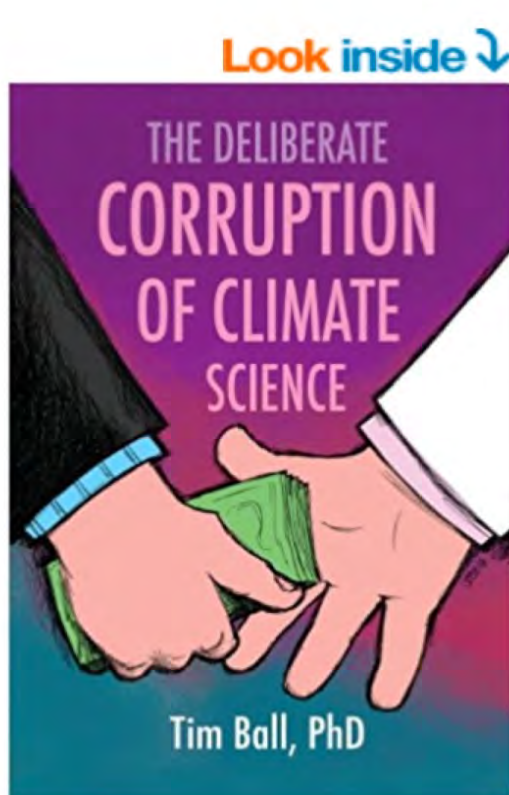
**This Changes Everything:  
Capitalism vs. The Climate** Kindle  
Edition  
by Naomi Klein (Author)  
★★★★☆ 862 customer reviews

See all 17 formats and editions

|                               |  |
|-------------------------------|--|
| <b>Kindle</b><br>\$12.99      | <b>Hardcover</b><br>from \$4.46  |
| Read with Our <b>Free App</b> | 85 Used from \$4.46<br>13 New from \$25.53<br>7 Collectible from \$10.00 |

The most important book yet from the author of the international bestseller *The Shock Doctrine*, a brilliant explanation of why the climate crisis challenges us to abandon the core “free market” ideology of our time, restructure the global economy, and remake our political systems.

[Read more](#)

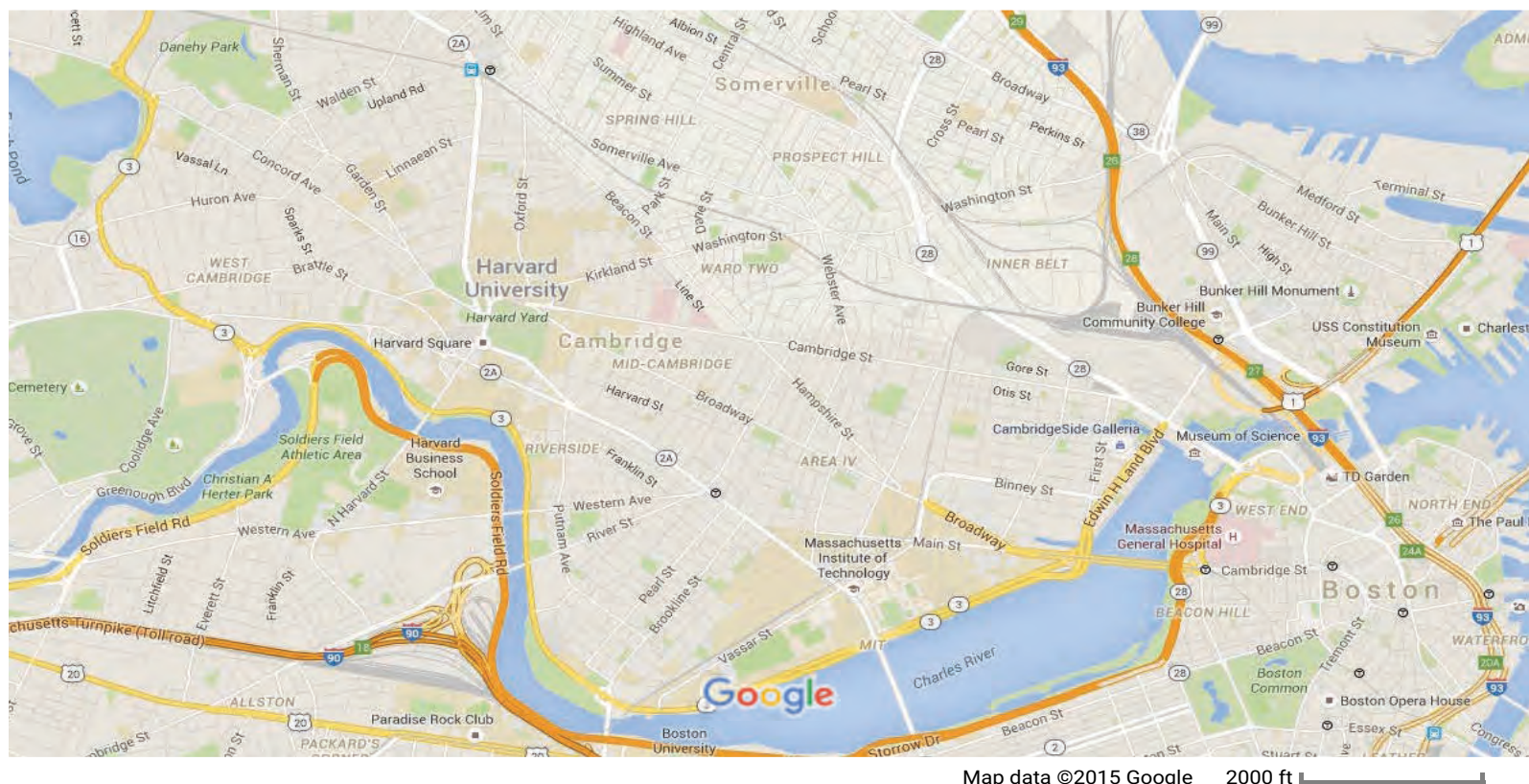
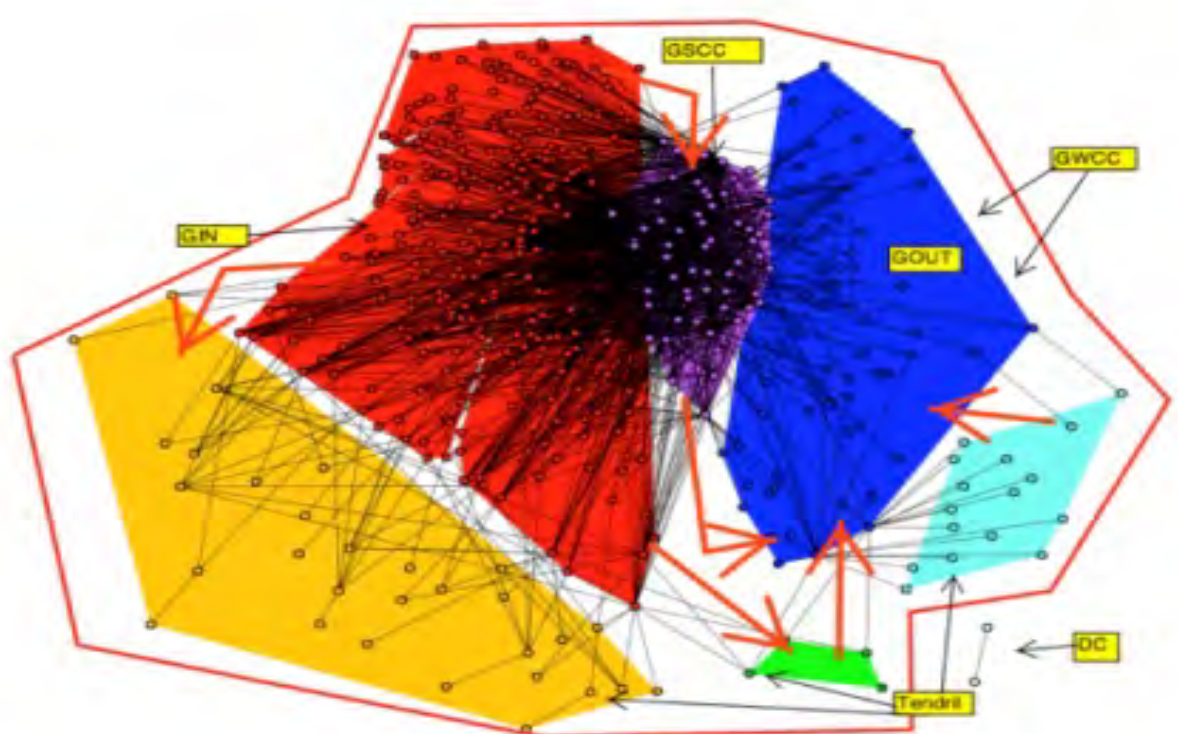
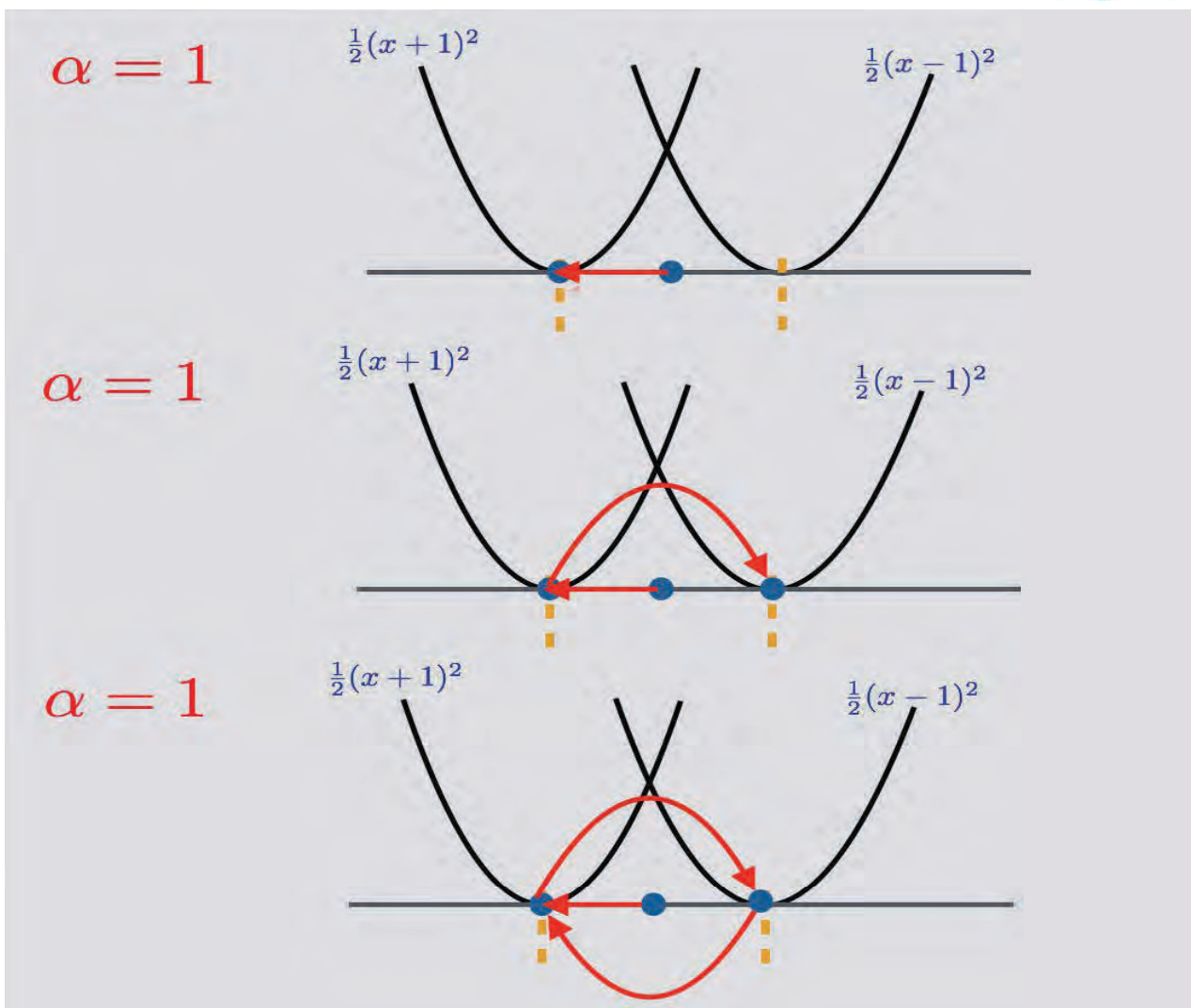


**The Deliberate Corruption of Climate  
Science** Paperback – January 21, 2014  
by Tim Ball (Author)  
★★★★☆ 171 customer reviews

See all 2 formats and editions

|                               |  |
|-------------------------------|--|
| <b>Kindle</b><br>\$9.95       | <b>Paperback</b><br>\$16.64                |
| Read with Our <b>Free App</b> | 12 Used from \$9.19<br>20 New from \$16.57 |

Dr. Tim Ball exposes the malicious misuse of climate science as it was distorted by dishonest brokers to advance the political aspirations of the progressive left.





# Sasha Rakhlin

## Machine Learning, Statistics, and Optimization

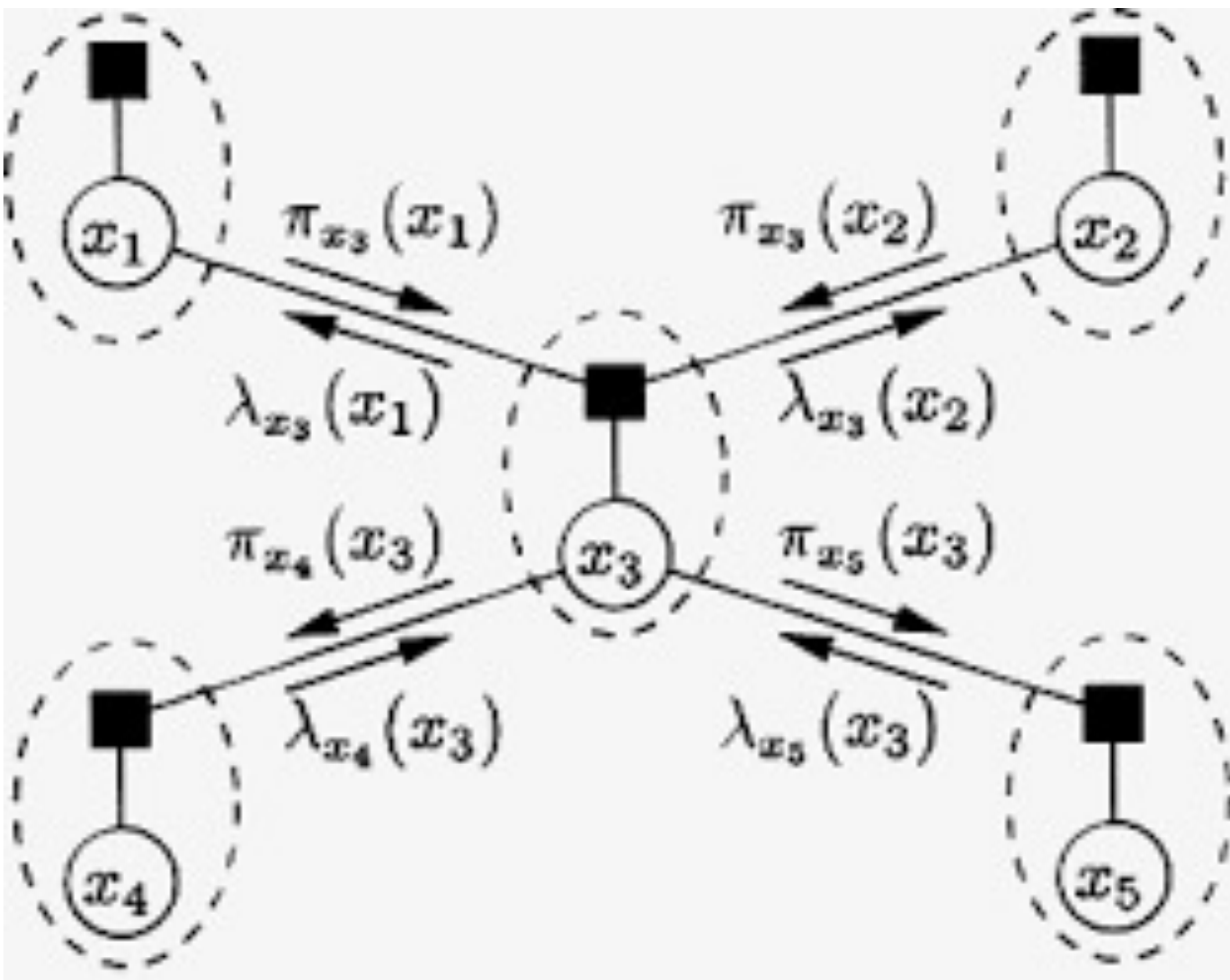
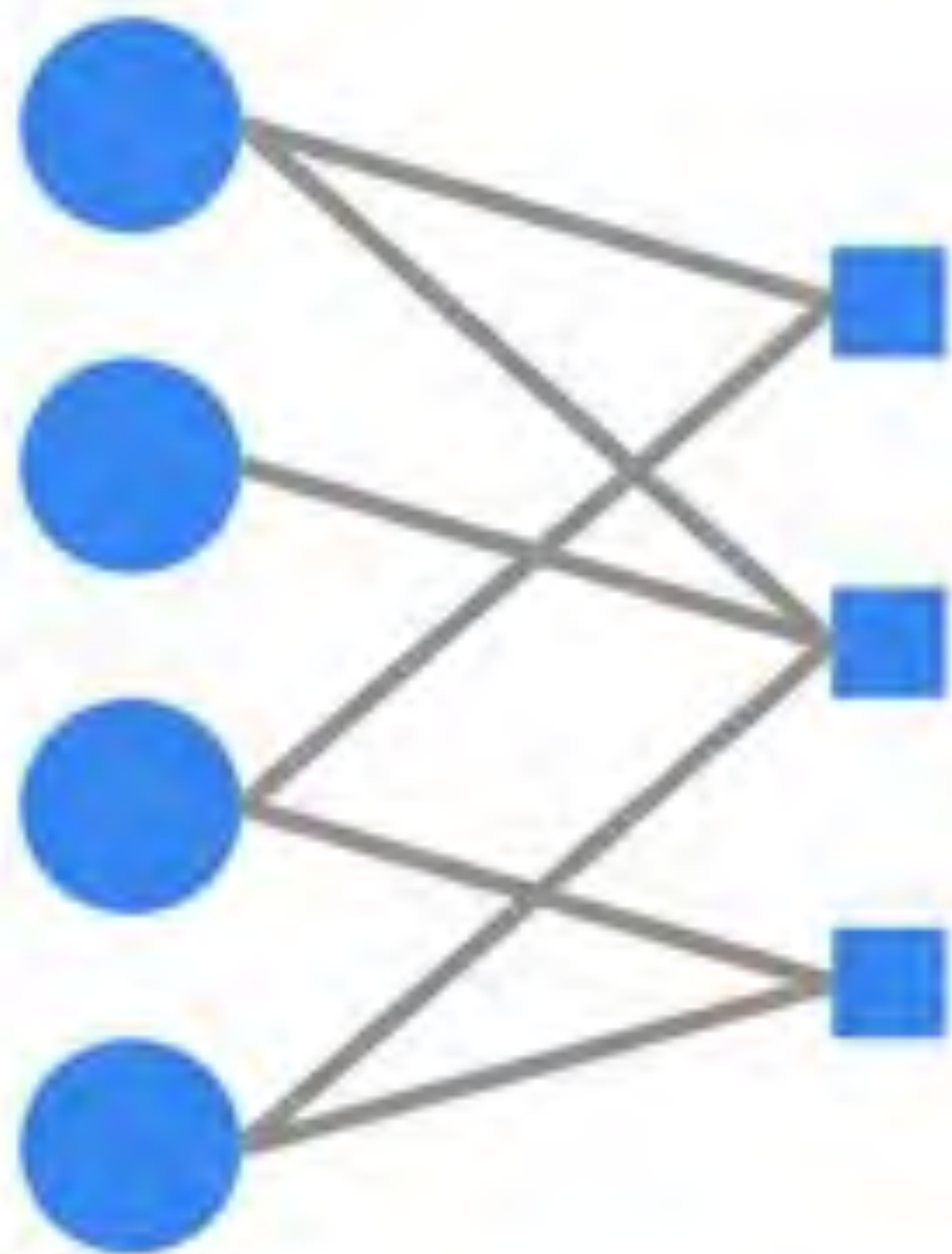
**Statistical Learning:** We study the problem of building a good predictor based on an i.i.d. sample. While much is understood in this classical setting, our current focus is large overparametrized models, such as those employed in deep learning. In particular, we study various measures of complexity of neural networks that govern their out-of-sample performance. Our recent focus is on statistical and computational aspects of interpolation methods, as well as understanding the phenomenon of benign overfitting in overparametrized models.

**Contextual Bandits and Reinforcement Learning:** In these problems, data are collected in an active manner and feedback is limited. Our work focuses on understanding the sample complexity and on developing computationally efficient methods. Among the highlights is a recent reduction from these decision-making problems to Supervised Learning.

**Online Learning:** We aim to develop robust prediction methods that do not rely on the i.i.d. or stationary nature of data. In contrast to the well-studied setting of Statistical Learning, methods that predict in an online fashion are arguably more complex and nontrivial. This field has some beautiful connections to Statistical Learning and the theory of empirical processes.



Social Data Processing



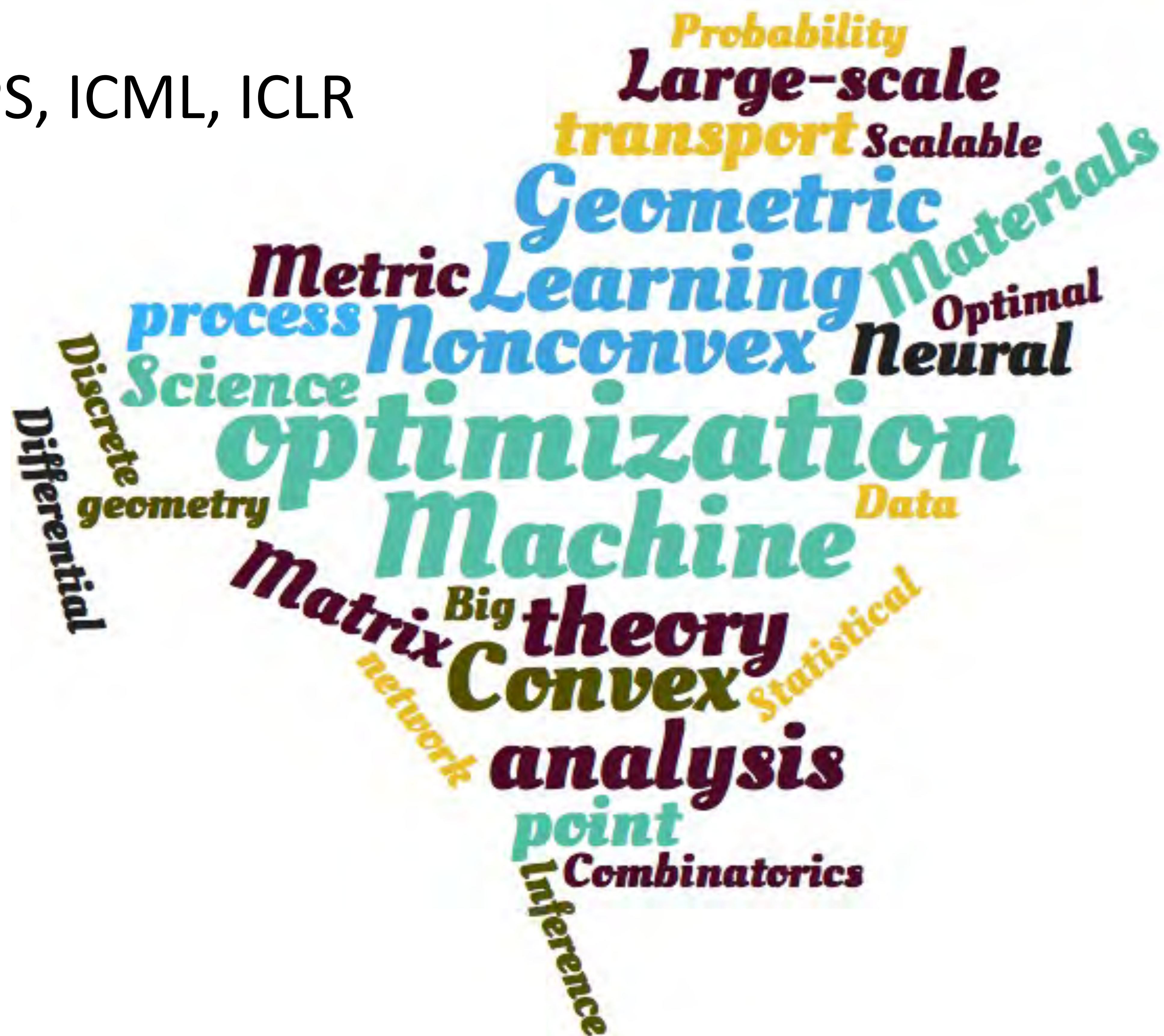
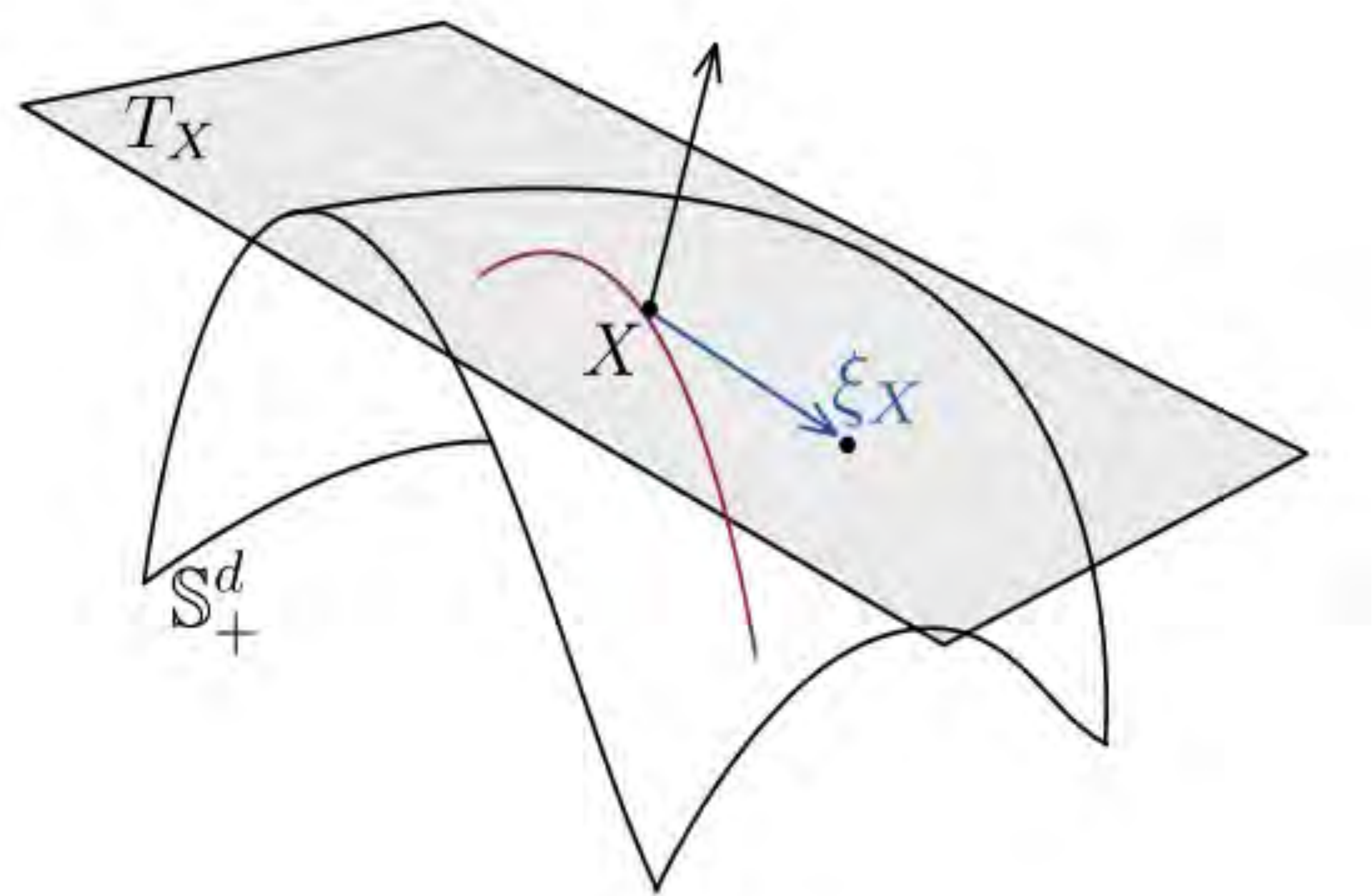
Probabilistic Graphical Models

Network Algorithms



We work on theory, analysis, and development of mathematical models for optimization, sampling, and machine learning with a particular focus on non-convexity and geometry. **determinantal**

Main conferences: COLT, NeuRIPS, ICML, ICLR





# Caroline Uhler

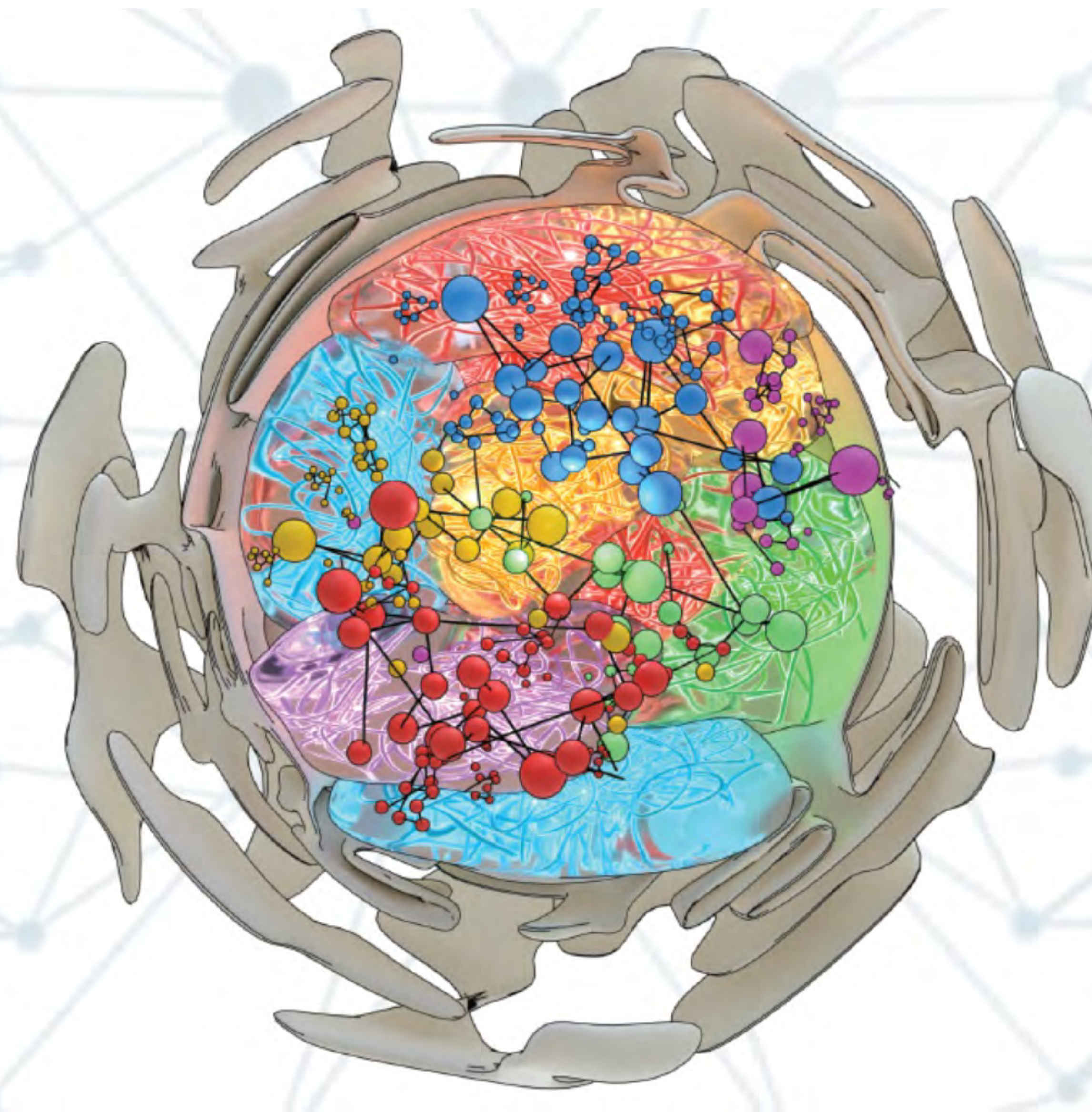
*«Our research is about understanding genome packing and regulation in health and disease by developing the next generation of machine learning and statistics methods that bridge the gap from predictive to causal modeling.»*



CAUSALITY

AUTO-  
ENCODERS

OPTIMAL  
TRANSPORT



DISEASE  
DIAGNOSTICS

DRUG  
DISCOVERY

REPRO-  
GRAMMING



# Data to AI Group

## Kalyan Veeramachaneni

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### **Systems for Machine Learning**

Automatic - feature engineering, machine learning task generation, modeling and creating interactive developers tools.

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### **AI for cyber security**

Spanning the gamut of malware detections exfiltration, explainable and adversarial AI.

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### **AI for software engineering**

How can we transform software engineering using machine learning?

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### **Applications**

Ranging from monitoring health of satellites, water pipes to healthcare and education.

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### **Our open source tools**

Use our software to build your own AI applications.



Research Vision: Our research combines

- ✓ theoretical analysis for determination of fundamental performance limits;
- ✓ the design of practical algorithms that approach such ultimate limits; and
- ✓ experimentation, both for validation and for developing realistic models

Network  
(experimentation)

Network  
(theory)

Interference  
Coexistence

Time-aware  
networks

Location-aware  
networks

Intrinsic  
Secrecy

Quantum  
Networks

Physical layer  
(experimentation)

Physical layer  
(theory)

UWB  
Diversity Adaptive  
Techniques

Synchronization  
Acquisition

Ranging

Measurement  
Modeling



# LEARNING, AUTONOMY, & URBAN SYSTEMS

## Ideal impact of autonomous vehicles:

- Traffic accidents: -94% of serious crashes
- Congestion: -6.9 billion hours annually
- Access to mobility: +30% of population
- Energy: 31% from transportation

## Actual uncertainty (with 100% adoption):

**-40%** to **+100%** energy consumption

How can we better understand and shape the impact of technology on society?

Need principled methods, informed by theory

Goal: reliable decision making (control, policy)

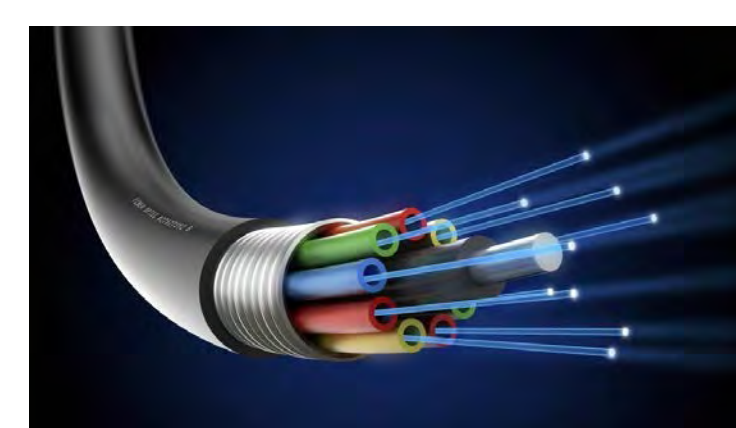
We are building technology faster and faster

Big, messy, complicated, structured

**Reinforcement learning, machine learning, optimization, control**



**Vehicles, transportation systems, urban planning & policy**



**Autonomy**



**Urban systems**

