## The Frazzoli Group at ETH Zurich





# The Frazzoli Group

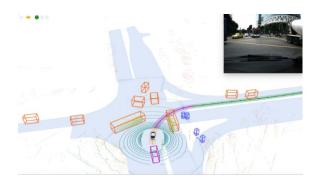
Department of Mechanical and Process Engineering (D-MAVT)

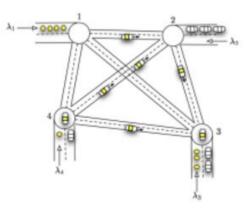
Institute for Dynamic Systems and Control (IDSC)

- Staff
  - 2 Administration
  - 2 Senior assistants
  - o 3 Ph. D. students
  - 3 Technical staff
  - ~15 students (rolling average) at Master and Bachelor level



## **Main directions**







Planning, control, perception, learning for AVs, embodied AI Transportation networks and autonomous mobility on demand robotics education and dissemination

# **Main directions**

- Autonomous vehicles
- Smart (urban) mobility





An autonomous go-kart

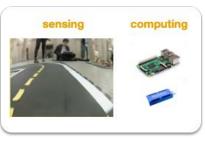
Duckietown: an accessible platform for smart mobility rapid prototyping

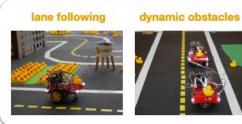


# The AI Driving Olympics

AIDO 1: The first *embodied learning* competition at NIPS 2018 AIDO 2: Second edition at ICRA 2019 AIDO 3: Third edition at NeurIPS 2019

### Platform





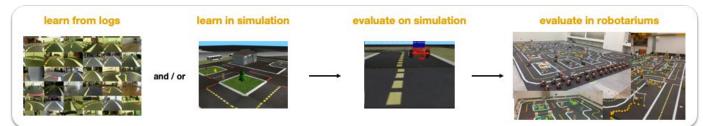
### The second s

Challenges





#### **Reproducible Learning Protocol**



- Simulation to reality: can we learn in simulation and act in reality?
- Granularity in learning: should we learn modules, or end-to-end architectures?
- Can we learn complex tasks, instead of simple sensorimotor skills?
- How can we deal with resource constraints? (e.g. planning-aware perception.)

#### For more information: AI-DO.duckietown.org

## **ETH** zürich

nuTonomy

ETH Zürich, University of Montréal, NCTU (Taiwan), TTIC (Chicago), Tsinghua (China), Georgia Tech, Duckietown Foundation, nuTonomy, Amazon Web Services.

amazon

webservices



# **Machine Learning for Robotics**

Special circumstances of embodied AI

- Real-time constraints
- Limited training data
- Disturbances in data

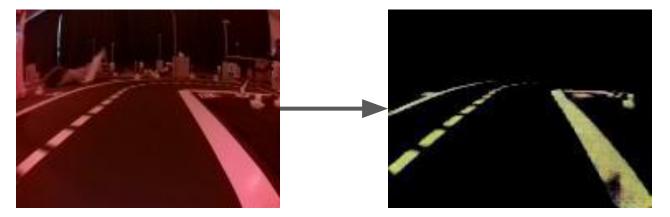
AI Driving Olympics as a testbed





## **Machine Learning for Robotics**

Focus on methods to increase "structure" in data using learning







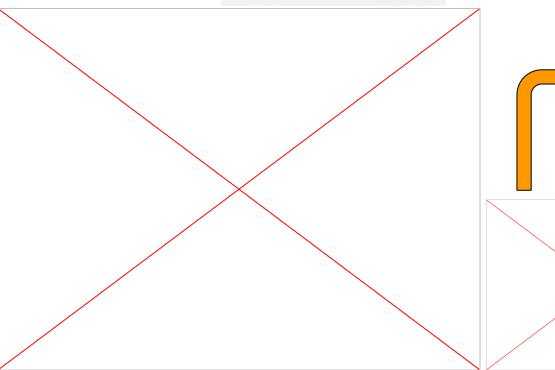
## Multimodal sensing - Does a hierarchy of sensors exists?

### Zauron:

- Rgb
- Thermal
- Event-based



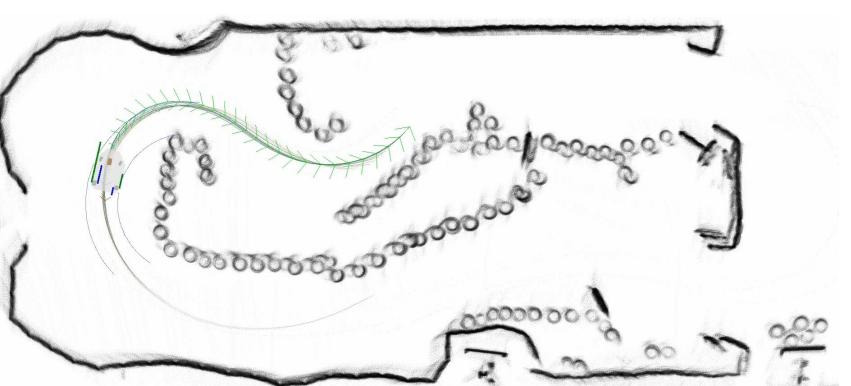
In **wormhole learning** we showed how learning to recognize objects across modalities is beneficial even for the first "teacher".





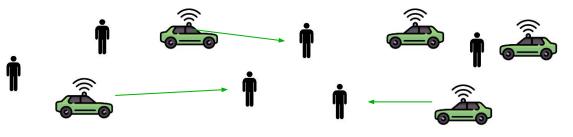
## Autonomous Go-kart

- Trajectory planning at speeds up to 20 km/h
- Advanced control for speeds up to 32 km/h





## Mobility-on-Demand: Fleet Control & Transportation System Analysis



A well-performing autonomous mobility-on-demand system uses as few taxis as possible to pickup and deliver as many customers as possible with minimal waiting and journey times while keeping the fleet mileage to a minimum.



### Some examples of past and answered research questions:

- What influence do **fleet operational policies** have on service **quality and price?** [Hörl, Sebastian, et al. "Fleet control algorithms for automated mobility: A simulation assessment for zurich." *Transportation Research. Part C, Emerging Technologies* (2018).]
- End-to-end reinforcement learning, can fleet operational policies be acquired with reinforcement learning? [Fluri, Christian, et al. "Learning to Operate a Fleet of Cars." *European Control Conference (ECC 2019)*. ETH Zurich, 2018.]
- Model-free rebalancing: where should empty vehicles be replaced (rebalanced) if no model of the demand is available? [Ruch, Claudio, et al. "The+ 1 Method Model-Free Adaptive Repositioning Policies for Robotic Multi-Agent Systems." (2019).]
- How large is the price of anarchy, i.e., the performance loss due to lack of fleet coordination? [Ruch, Claudio, Spencer Richards et al. "The Value of Coordination in mobility-on-demand systems" (2019).]