

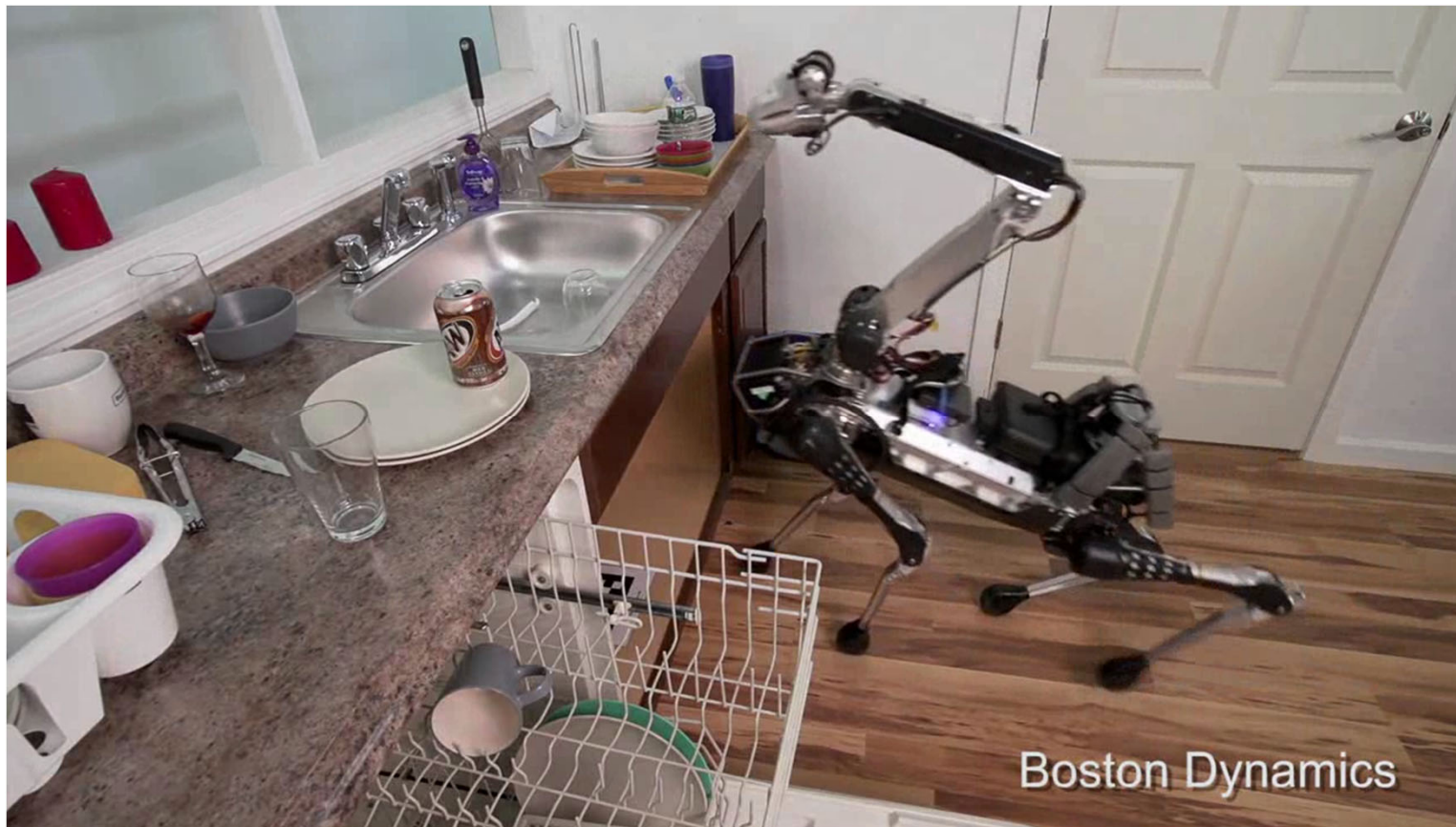


# Master in Computational Science and Engineering Specialization in Robotics

ETH Zurich, D-MAVT, D-INFK, D-ITET, D-HEST



## Robotics tomorrow | Service Robots outside the production halls



SpotMini | electric quadruped, Boston Dynamics

<https://www.youtube.com/watch?v=tf7IEVTDjng>

## Service Robots | Key Challenges

Our real “physical” world is **multimodal**, very **diverse** and **complex**.

We need robots that ...

- ... can dealing with **uncertain** and **partially available information**
- ... **see, feel** and **understand** their environment
- ... have **torque** and **force** control for tactile interaction (“soft robots”)
- ... offer **intuitive human-machine interfaces**
- ... **learn** and **adapt** every day

→ **all this requires AI/ML for intelligent control, but also novel sensing, actuation and robot concepts!!**

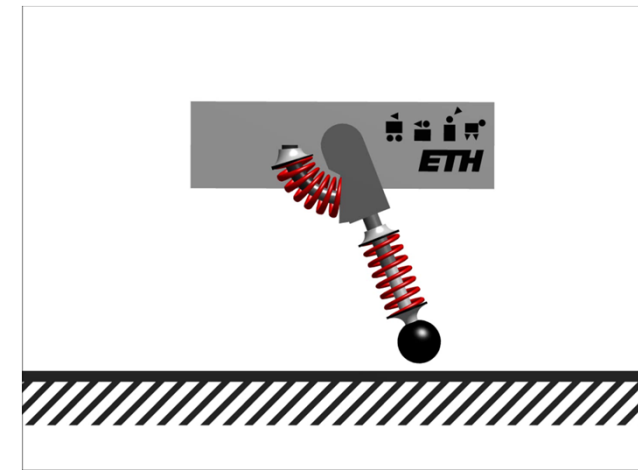


**50x speed**

<https://www.youtube.com/watch?v=gy5g33S0Gzo>

**Willow  
Garage**

## Walking Robot ANYmal | *designed for challenging environments*



Prof. Marco Hutter

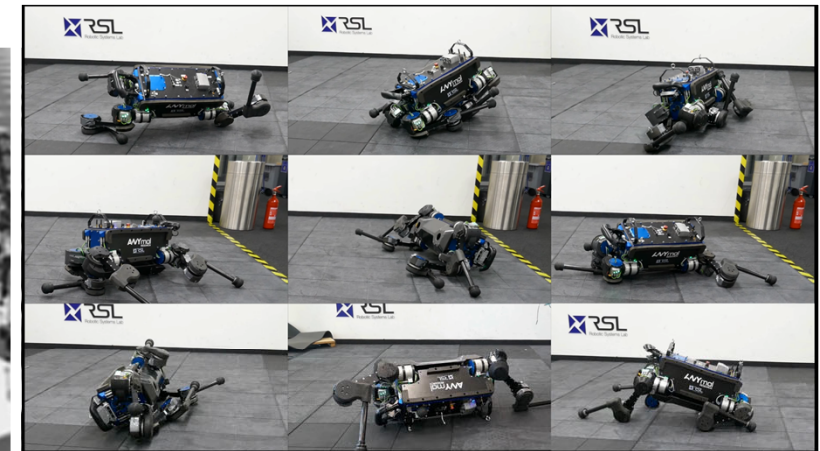
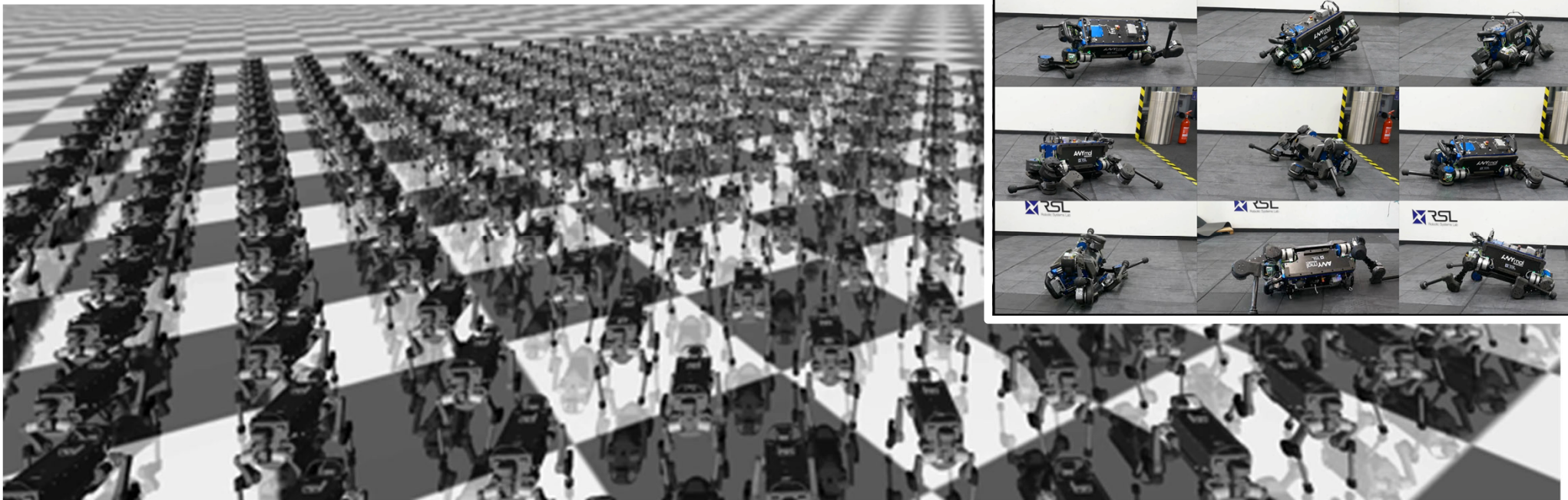
**ANYmal** – “soft” interaction with the environment  
| the ultimate quadruped

<https://www.youtube.com/watch?v=E11zBTYpXW0>



## Reinforcement Learning | robot learning to walk

- ▶ Goal: given the actual state, learn the best action (leg movements) to achieve the optimal next state.



## Service Drones | flying robots for challenging tasks

**wingtra** – most elegant VTOL

| from student project to startup

<https://www.youtube.com/watch?v=QADvPDWtgFU>



**Atlantik** solar airplane

| 81 hours non-stop in summer 2015

| 5.64 m, 6.2 kg

[https://www.youtube.com/watch?v=8m4\\_NpTQn0E](https://www.youtube.com/watch?v=8m4_NpTQn0E)

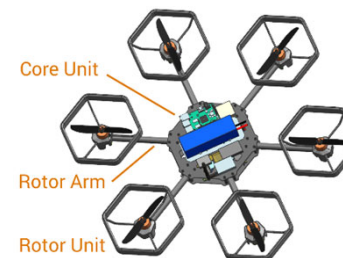
[https://www.youtube.com/watch?v=wyS6W1t\\_ryQ](https://www.youtube.com/watch?v=wyS6W1t_ryQ)



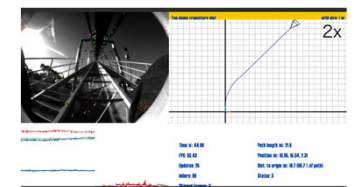
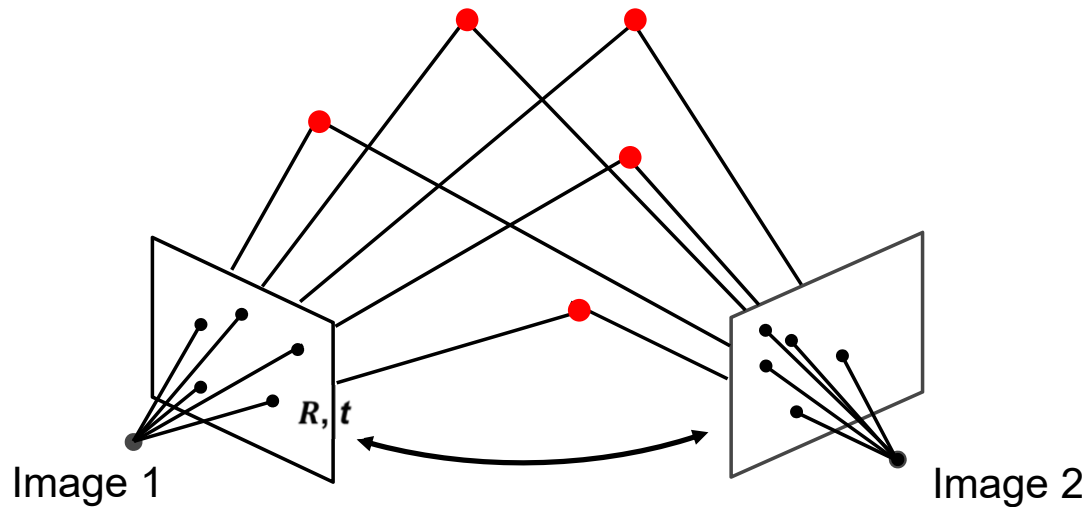
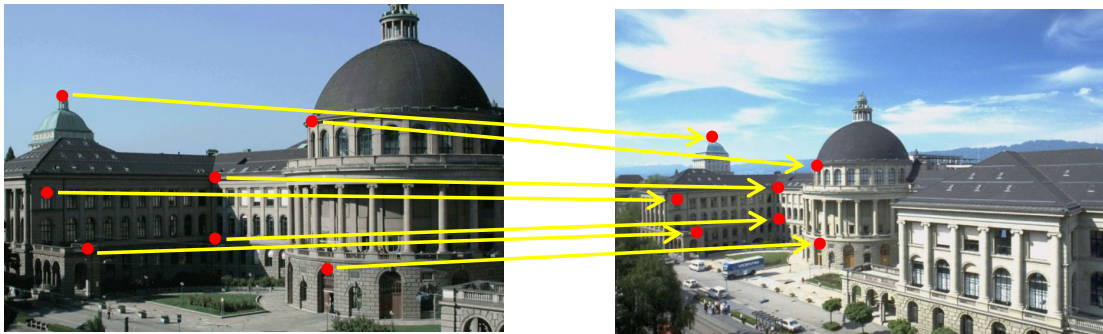
**Voliro** – future of flying robots

| the omni-directional multi-copter

[https://www.youtube.com/watch?v=9FJn\\_t-YCwM](https://www.youtube.com/watch?v=9FJn_t-YCwM)

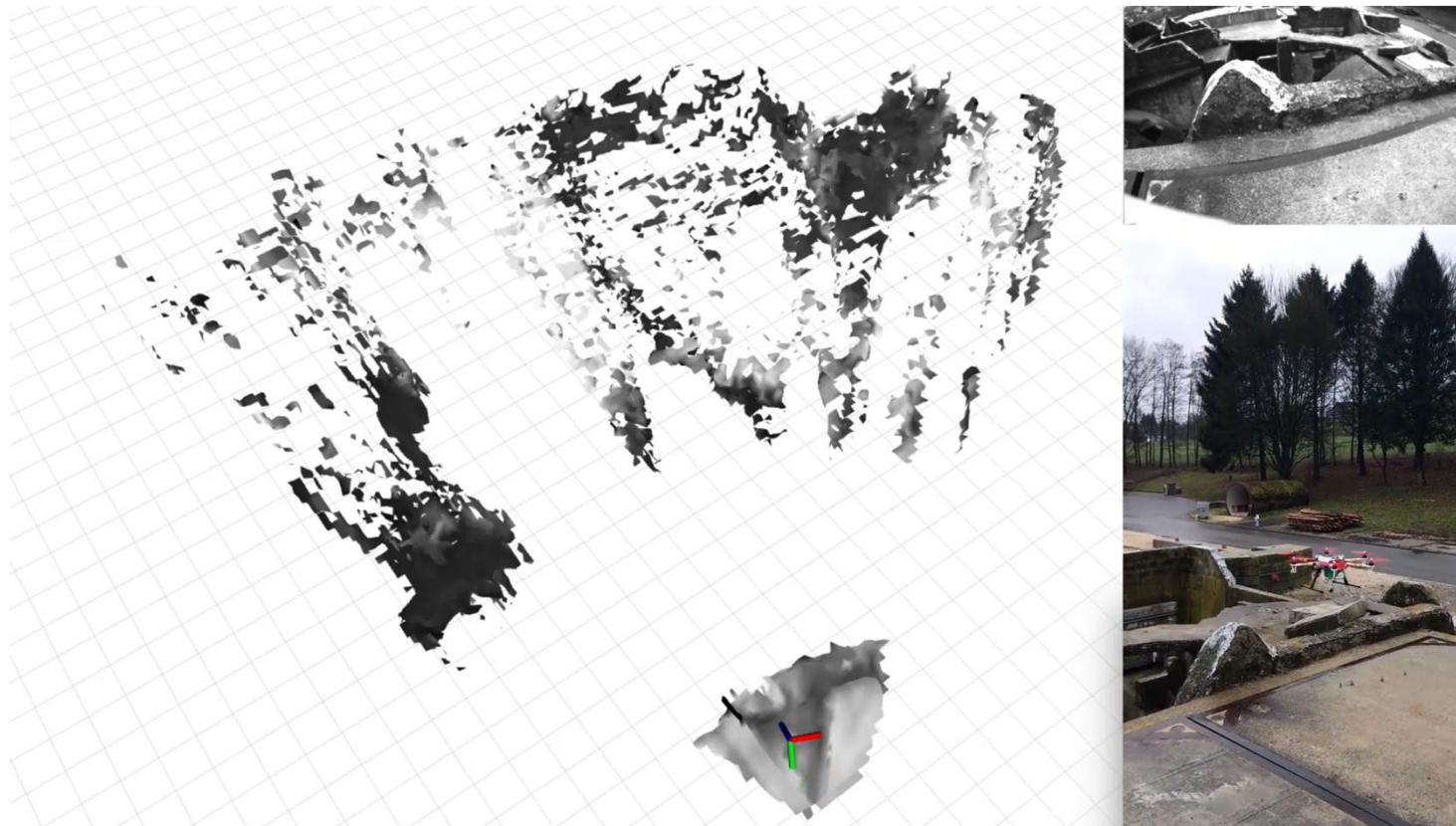


## “Seeing” | Visual-Inertial Motion Estimation



<https://www.youtube.com/watch?v=yvgPrZnp4So>

# 3D Reconstruction | on-board a drone





Interdisciplinary, exciting and highly demanded in industry

## ▶ Key Topics

### ◦ Systems Engineering

- Design and Optimization of Products and Systems

### ◦ Physical Modelling and Simulation

### ◦ Optimization and Control

### ◦ Perception, Graphics, Virtual Reality

### ◦ Embedded and Distributed Computing

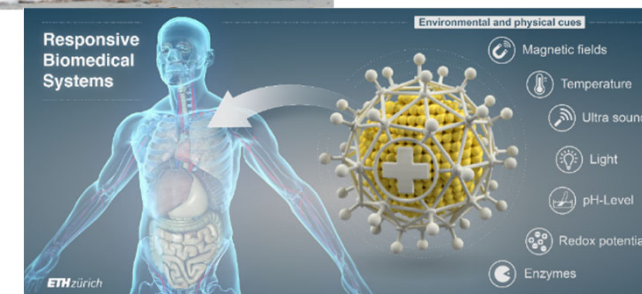
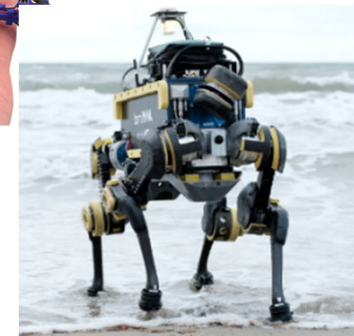
### ◦ Artificial Intelligence & Machine Learning

### ◦ Robotics

- Design, Modelling, Control and Intelligence

### ◦ Challenging Applications

- autonomous vehicles and transportation, VR/AR, search and rescue, smart agriculture and construction, energy technology, biomedical and much more.



Field of Specialization “**Robotics Courses**” (Contact: Roland Siegwart, D-MAVT)

Course*	SWS	Sem.	Dep.	KP
<b>Theory of Robotics and Mechatronics</b>	3G	HS	MAVT	4
<b>Autonomous Mobile Robots</b>	4G	FS	MAVT	5
<b>Probabilistic Artificial Intelligence</b>	2V 1U 1A	HS	INFK	5
<b>Deep Learning</b>	2V 1U	HS	INFK	4
<b>Computer Vision</b>	3V 1U 1A	HS	INFK	6
<b>Image Analysis and Computer Vision</b>	3V 1U	HS	ITET	6
<b>Dynamic Programming and Optimal Control</b>	2V 1U	HS	MAVT	4
<b>Recursive Estimation</b>	2V 1U	HS	MAVT	4
<b>Robot Dynamics</b>	2V 1U	HS	MAVT	4
<b>Machine Learning</b>	3V 2U 2A	HS	INFK	8
<b>3D Vision</b>	3G	FS	INFK	4
<b>Seminar in Robotics for CSE</b>		HS / FS	RW	4

\* **five courses** from the fields of specialization, including the seminar

## Core Faculty in Robotics (for Projects and Seminars)

### D-MAVT

- Margarita Chli
- Raffaello D'Andrea
- Emilio Frazzoli
- Marco Hutter
- Robert Katzschmann
- Brad Nelson
- Roland Siegwart
- Melanie Zeilinger



### D-INFK

- Stelian Coros
- Otmar Hilliges
- Marc Pollefeys
- Siyu Tang



### D-ITET

- Roy Smith
- Luc van Gool



### D-HEST

- Roger Gassert
- Robert Riener
- Simone Schürle



## Recommended Lecture Series by International Experts

- ▶ **Distinguished Seminars in Robotics, Systems and Controls**

- [http://www.msrl.ethz.ch/education/Distinguished\\_Seminar\\_RSC.html](http://www.msrl.ethz.ch/education/Distinguished_Seminar_RSC.html)

- ▶ **ETHZ Control Seminars**

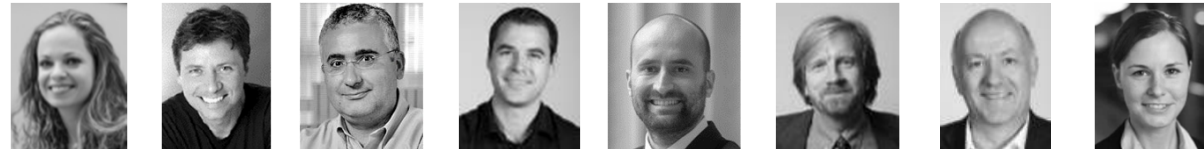
- <http://control.ee.ethz.ch/>

- ▶ **ETHZ Computer Science Colloquium**

- <http://www.inf.ethz.ch/news/colloquium/>

# Research Overview of Core Faculty in Robotics

**D-MAVT**



**D-INFK**



**D-ITET**



**D-HEST**



## Prof. Dr. Margarita Chli

### ► Affiliation:

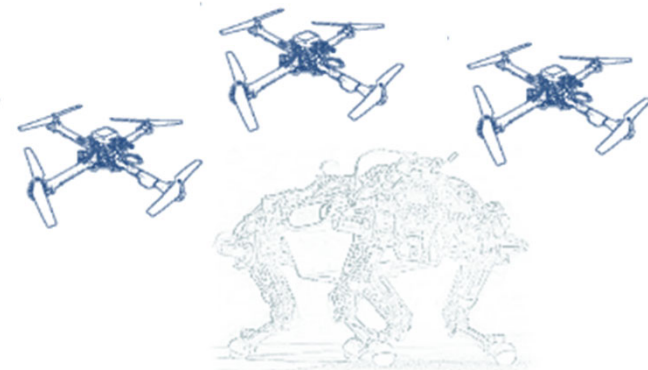
- D-MAVT
  - Vision for Robotics Lab

### ► Research Areas

Vision-based perception for robots

– focus on small UAVs

- Robot Navigation
- Scene Reconstruction / Understanding
- Collaborative Robot sensing & mapping



## Examples of Research Projects



### MONOCULAR CAMERA



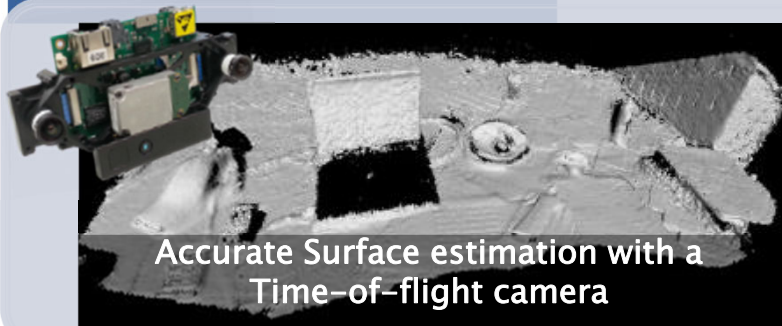
Online Scene Reconstruction for UAV navigation



Place Recognition for multi-robot missions



### OTHER VISION-BASED SENSORS



Accurate Surface estimation with a Time-of-flight camera



Event-based cameras for Robot Navigation

## Prof. Dr. Raffaello D'Andrea

### ► Affiliation:

- D-MAVT
  - Institute for Dynamic Systems and Control

### ► Research Areas

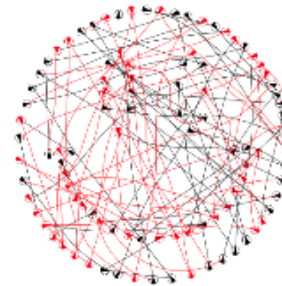
- Design and control of distributed, autonomous systems
- Design and control of systems capable of complex motion
- For example:
  - Systems with many interconnected components
  - Systems that learn from experience and improve their performance over time
  - Autonomous vehicles that perform complex tasks and maneuvers



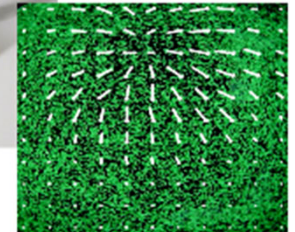


## Examples of Research Projects

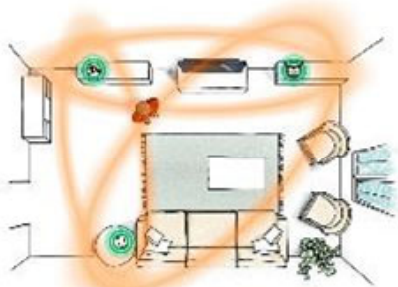
Vision-based robotic skins



Co-ordination of robot swarms

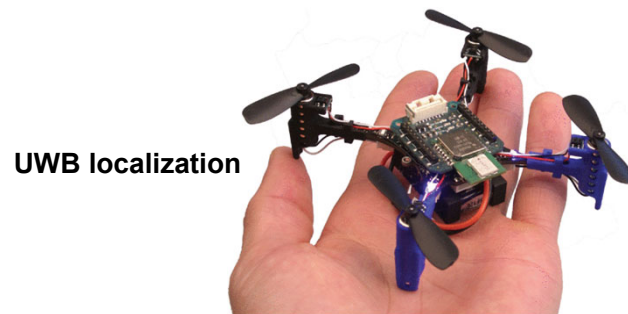


Machine learning for tactile sensing

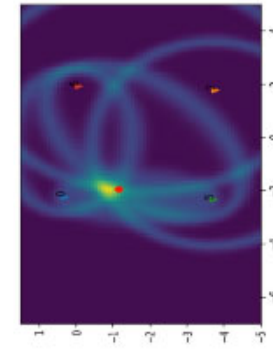
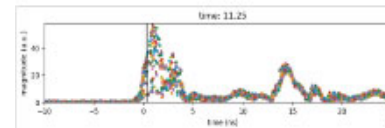


Radar networks

Soft inflatable robotics



UWB localization



UWB radar networks

## Prof. Dr. Emilio Frazzoli



### ► Affiliation:

- D-MAVT
  - Institute for Dynamic Systems and Control

### ► Research Areas

#### ◦ **Autonomous Vehicles**

Enable vehicles such as cars and airplanes to safely and reliably drive/fly themselves in an uncertain, dynamic world (public roads, national airspace).

#### ◦ **Control of Transportation Systems**

Advanced control and optimization methods to enable new concepts for large-scale transportation systems.

#### ◦ **Theoretical foundations**

Advance the state of the art in foundational areas such as Control Theory, Algorithmic Robotics, System Design and Optimization

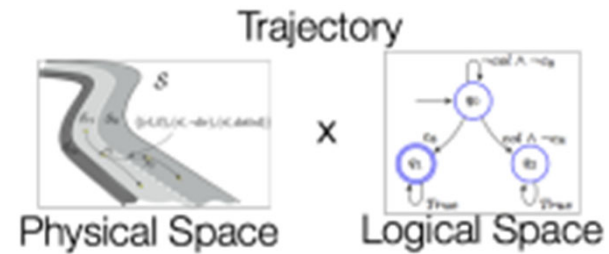
## Examples of Research Projects



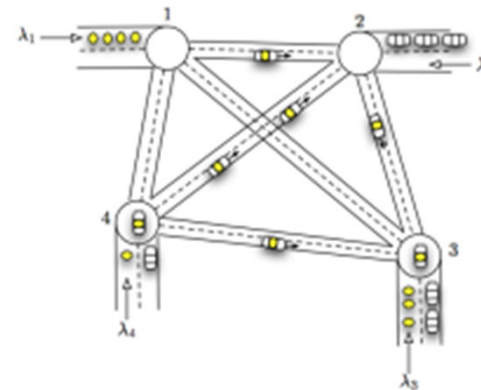
**Planning and decision making for AVs**



**High-performance control**



**Planning with rules of the road**



**Mobility on Demand**

## Prof. Dr. Marco Hutter



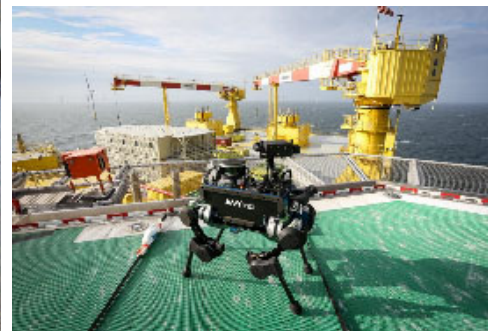
### ► Affiliation:

- D-MAVT
  - Institute of Robotics and Intelligent Systems
  - Robotic Systems Lab

### ► Research Areas

- Planning and control for locomotion and manipulation
  - Machine learning, non-linear optimization and model-predictive control
- Autonomous navigation and exploration
  - Environment perception and haptic sensing
- System and actuator design
  - Quadrupedal robots, mobile manipulators, autonomous construction machines
- Real-world applications
  - Search and rescue, industrial inspection and maintenance, construction and forestry,...

## Examples of Research Projects



## Prof. Dr. Robert Katzschmann



### ► Affiliation:

- D-MAVT
  - Institute of Robotics and Intelligent Systems
  - Soft robotics

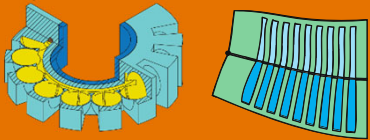
### ► Research Areas

*“Controlled Soft Robots Tackling Manipulation and Locomotion Challenges”*

- Underwater Soft Robots
- Manipulation with Soft Hands
- Real-time Simulation of Soft Robots
- Model-based Control for Soft Robots
- Scalable Fabrication of Soft Robots

## Examples of Soft Research Projects

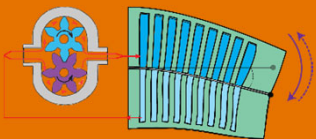
### Design



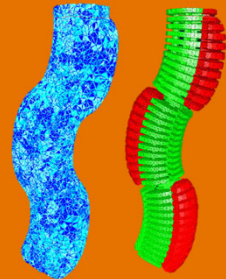
### Fabrication



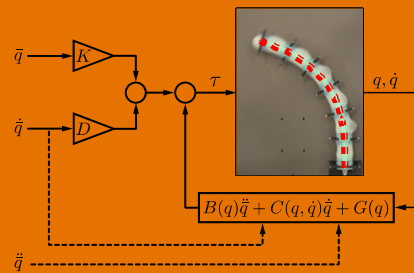
### Actuation



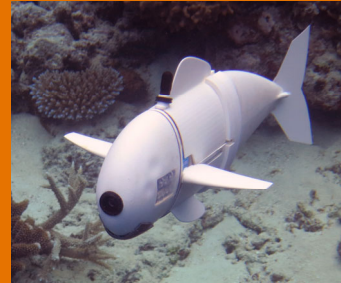
### Modeling



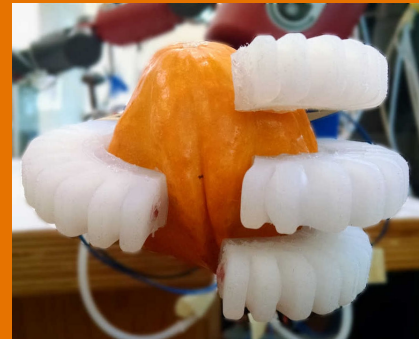
### Control



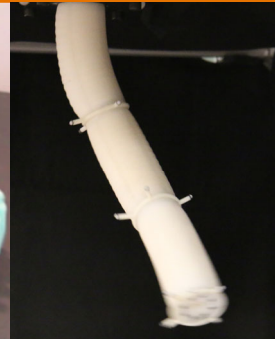
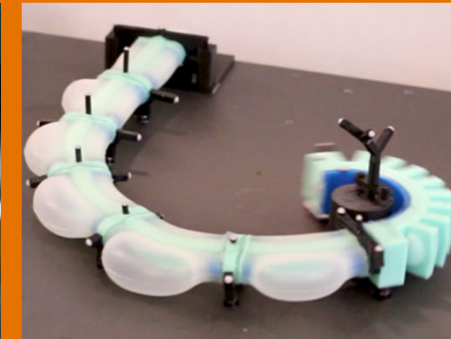
### Biomimetic underwater robots



### Adaptable hands



### Dynamic soft manipulators



## Prof. Dr. Brad Nelson

### ► Affiliation:

- D-MAVT
  - Institute of Robotics and Intelligent Systems
    - Multi-Scale Robotics Lab



### ► Research Area

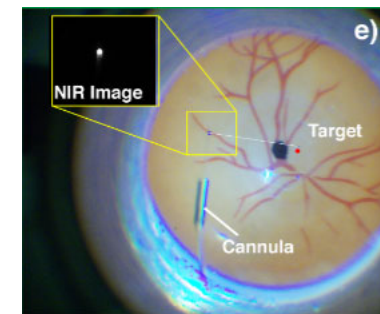
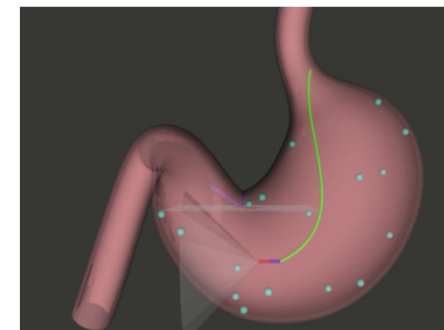
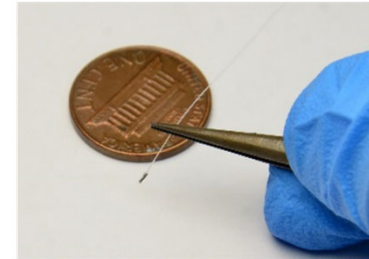
- Micro and Nano Robotics
  - Autonomous Micro and Nano Robots
    - Design and Fabrication
    - Localization, Locomotion, Control
    - Biomedical Applications
  - Micro and Nano Manipulation
    - Sensor and Actuator Development
    - Fluidic and Self Assembly
  - Applications in Biology and Biomedical Engineering





## Examples of Research Projects

- Design and fabrication of biomedical micro-robots
- Soft robotics for medical applications
- Magnetic manipulation for intra-body navigation



22.06.2020

## Prof. Dr. Roland Siegwart

### ► Affiliation:

- D-MAVT
  - Institute of Robotics and Intelligent Systems
  - Autonomous Systems Lab

### ► Research Area

- Mission and Dedication
  - To create intelligent robots and systems that operate autonomously in complex and dynamic environments.
- Research Focus
  - Novel robot concepts that are best adapted for ground, air, or water based applications.
  - New algorithms for perception, localization, abstraction, mapping, and path planning that will enable autonomous operation in challenging environments.



## ASL – ETH Zurich

<https://www.youtube.com/user/aslteam>



### Autonomous Delivery Robots and Cars

*Visual navigation and autonomous operation in city environments*



### Unmanned Aerial Vehicles

*Design, control and fully autonomous operation in complex environments*



### Solar Airplanes

*Continuous flight for long-term environment monitoring*



### Underwater Robots

*Design and autonomous navigation of underwater robots in rivers*



### Mobile Manipulation

*Object handling for manufacturing, logistics, and e-commerce*



### Service Robots

*Navigation and transportation in our daily environment*

## Prof. Dr. Melanie Zeilinger

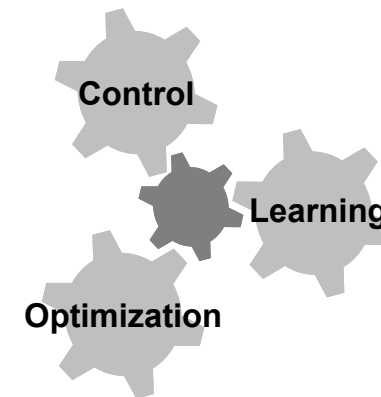


### ► Affiliation:

- D-MAVT
  - Institute for Dynamic Systems and Control

### ► Research Areas

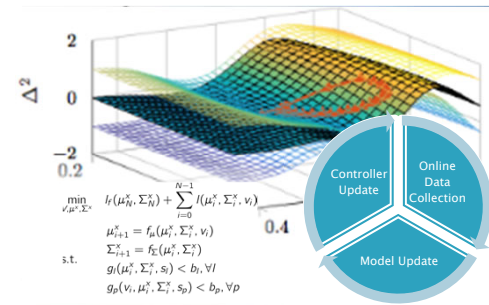
- Systems and Control Theory
  - Distributed Control of System Networks
  - Safe Learning-based Control
- Optimization Methods
  - Real-time Methods for Control
- Application to Robotic and Human in the Loop Control Systems



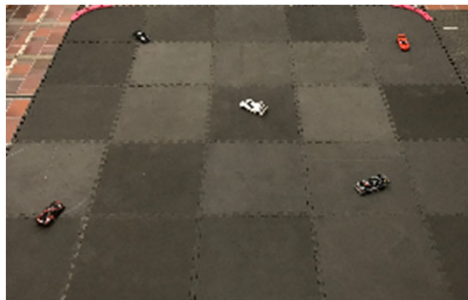
## Examples of Research Projects



Safety Filters for Learning-based Control



Predictive Control under Uncertainty



Cooperative Multi-Agent Systems



Personalized Control Systems

Lokomat®Pro by Hocoma AG,  
Volketswil, CH

## Prof. Dr. Stelian Coros



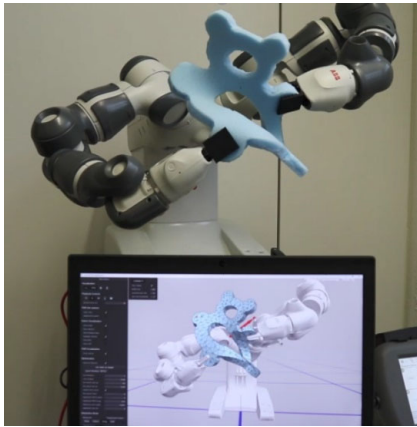
### ► Affiliation:

- D-INFK
  - Computational Robotics Lab (CRL)

### ► Research Area

- Engineering meets AI:
  - Algorithmic approaches to designing compliant robots
  - Exploiting multi-material 3D printing to create new types of robotic materials
- Computational models of motor control
  - Locomotion (wheeled, legged, hybrid, compliant systems), manipulation (both rigid and deformable objects), mobile manipulation, human-robot interaction, learning and optimal control methodologies

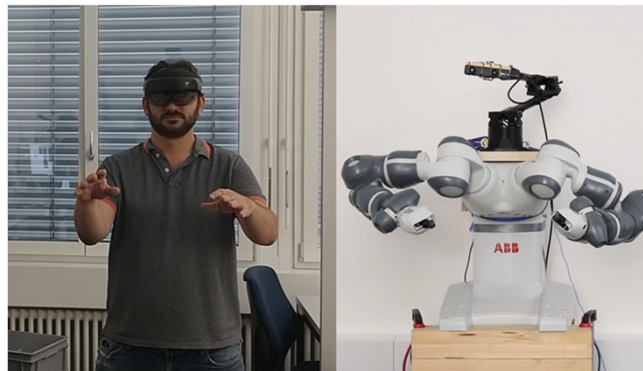
## Examples of Research Projects (<http://crl.ethz.ch/>)



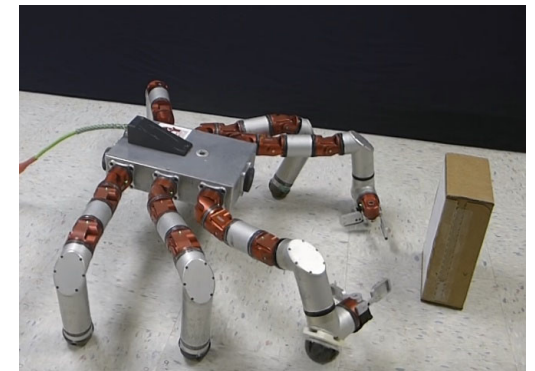
soft object manipulation



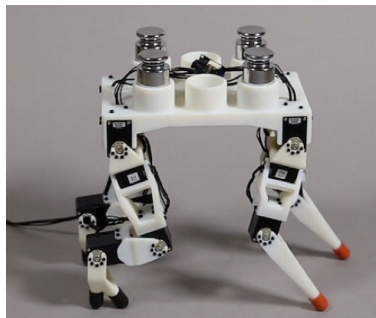
collaborative robots



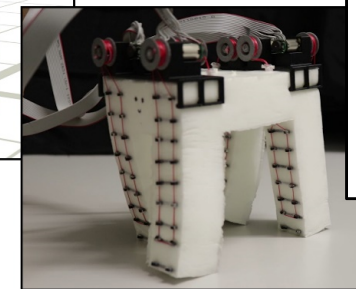
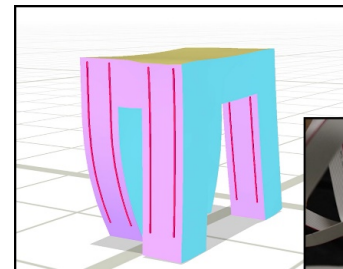
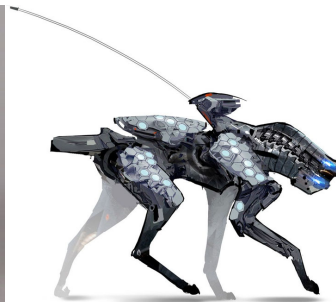
human-robot interaction



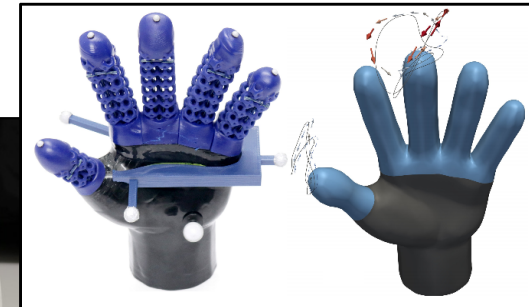
mobile manipulation



towards increasingly life-like legged robots



soft robotics



22.06.2020

## Prof. Dr. Otmar Hilliges



### ► Affiliation:

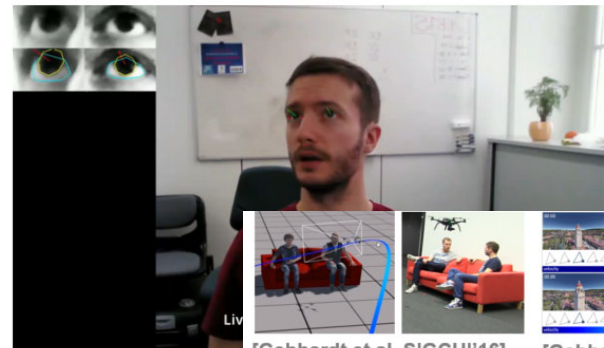
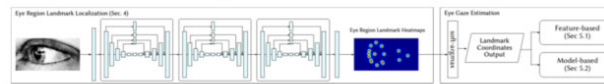
- D-INFK
  - Institute(s) for Pervasive Computing & Visual Computing
  - Advanced Interactive Technologies Lab

### ► Research Areas

- Intersection of machine learning, computer vision and robotics
- Deep learning for machine perception of human activity
- Applications in interactive systems and human-robot interaction



## Examples of Research Projects: Perception and Real-time control



[Gebhardt et al. SIGCHI'16]

[Gebhardt et al. WIP]

[Spurr et al. CVPR '18]

[P]

### Viewpoint + Visibility + Collision Avoidance



[Naegeli et al. RA-L '17]

Plan3D: Viewpoint and Trajectory Optimization for Aerial Multi-View Stereo Reconstruction

Our Reconstruction Surface Texture      Our Reconstruction Surface Normals

Initial Pattern and Reconstruction      Viewpoint Planning      Final Reconstruction

[Hepp et al. in submission Siggraph '18]

22.06.2020

## Prof. Dr. Marc Pollefeys



### ► Affiliation:

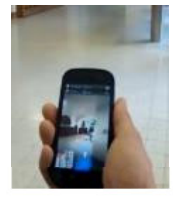
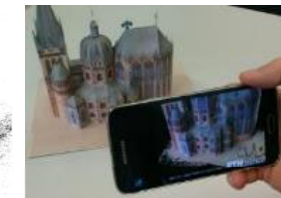
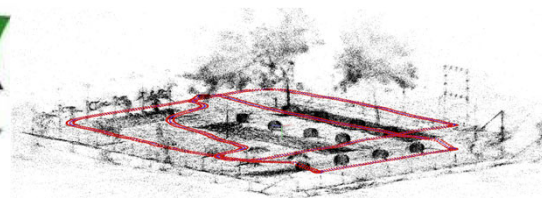
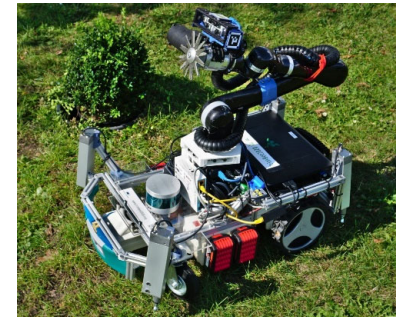
- D-INFK
  - Institute for Visual Computing
  - Computer Vision and Geometry Lab


### ► Research Area

- Computer Vision
  - 3D Modeling from Images
  - 3D Sensing, Sensor Calibration, Omni-Directional Vision
  - Real-Time Computer Vision
- Robot Vision
  - Visual Simultaneous Localization and Mapping
  - Mapping and Navigation for MAV, humanoid robots and cars

## Examples of Research Projects

- Autonomous Micro Air Vehicles
- Autonomous Driving
- Visual Localization
- 3D Mapping
- 3D Modeling of Interacting People
- Real-Time Embedded Computer Vision



 Project Tango



22.06.2020

## Prof. Dr. Siyu Tang

### ► Affiliation:

- D-INFK
  - Institute for Visual Computing
  - Computer Vision and Learning Group

### ► Research Areas:

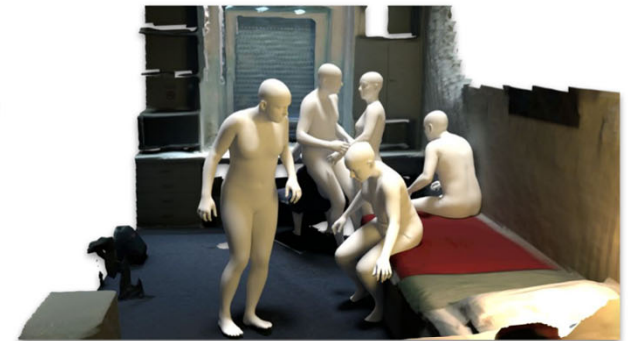
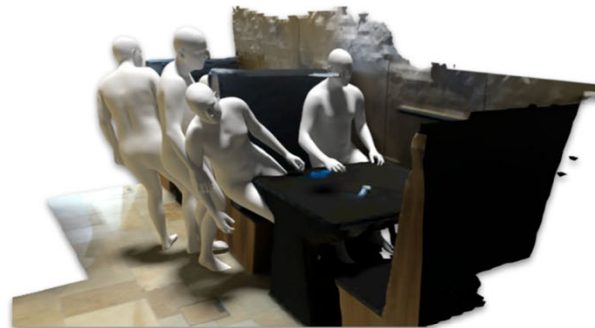
- Intersection of computer vision, machine learning and optimisation with focus on analysing and modelling people
  - People detection and tracking
  - Action understanding
  - Generative models of 3D human
  - Representation learning
  - Discrete optimisation for image and video analysis



## Examples of Research Projects



People detection and tracking



Generative models of human scene interaction



3D human modelling

## Prof. Dr. Roy Smith

### ► Affiliation:

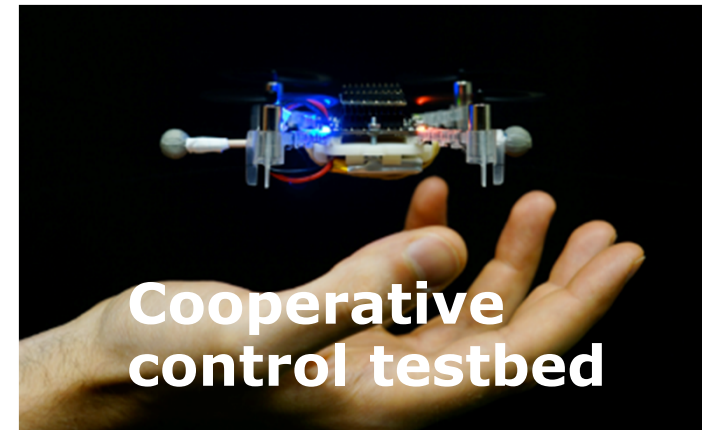
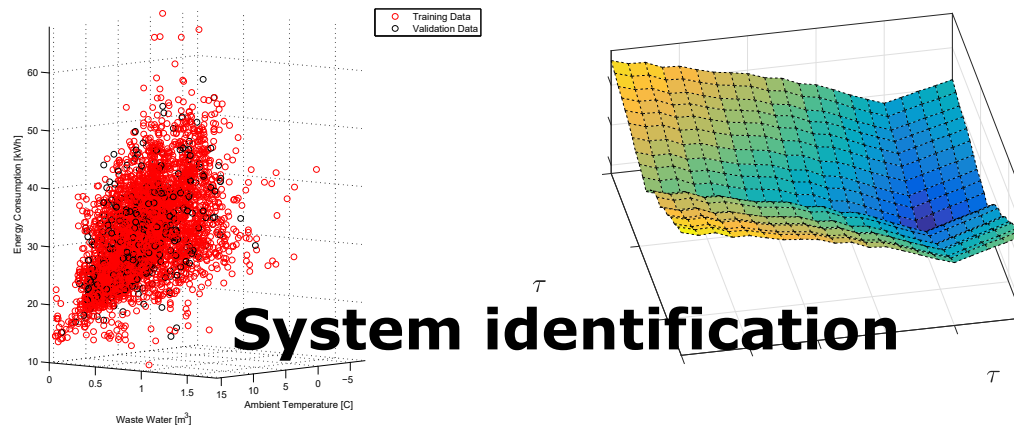
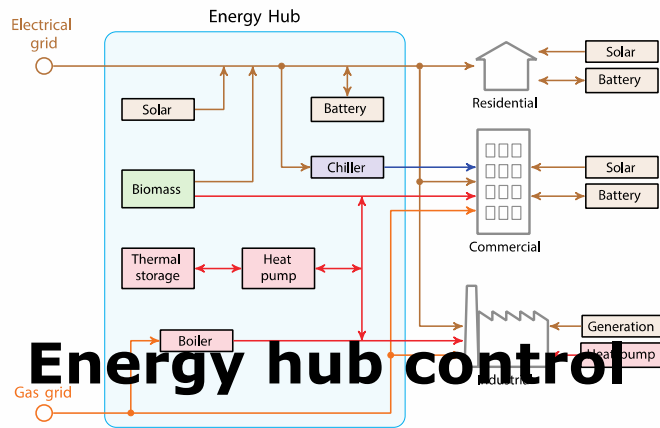
- D-ITET
  - Automatic Control Lab



### ► Research Areas

- System modeling and identification
- Distributed control systems
- Energy management in buildings and energy hubs
- Autonomous kites for power generation
- Robust control theory and applications
- Thermoacoustic machines

## Examples of Research Projects



## Prof. Dr. Luc van Gool



### ► Affiliation:

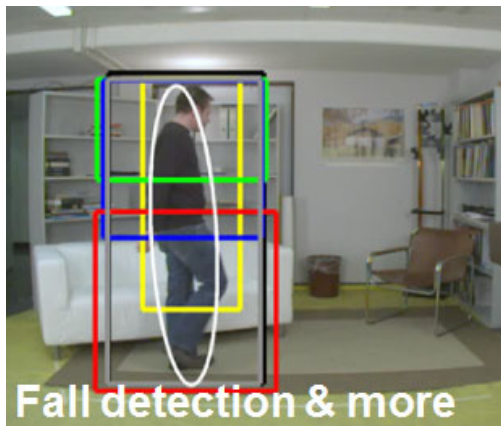
- D-ITET
  - Computer Vision Laboratory

### ► Research Areas

- Computer Vision
  - 3D modeling from images or with structured light
  - Object (class) recognition
  - Tracking and gesture analysis
  - Combinations of the above
- Robot Vision
  - Autonomous vehicles
  - Medical robots
- Surveillance
  - Anomaly detection



## Examples of a Research Projects



## Prof. Dr. Roger Gassert

*Using robotics, wearable sensors and non-invasive neuroimaging to explore, assess and restore sensorimotor function*



### ► Affiliation:

- D-HEST
  - Institute of Robotics and Intelligent Systems
  - Rehabilitation Engineering Laboratory

### ► Research Areas

- Haptics and Physical Human-Machine Interaction
  - Interaction control, sensor/actuator design and characterization
- Neuro-robotics and Rehabilitation
  - Robot/neuroimaging-assisted therapy, devices for home therapy
- Assistive Technology
  - Exoskeletons, brain-computer interfaces



## Examples of Research Projects

### Explore

- sensorimotor neuroscience & neuromechanics



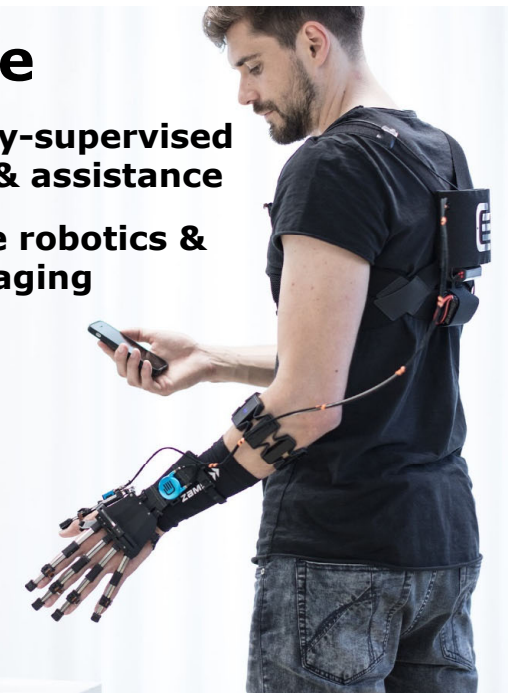
### Assess

- assessment tools & objective metrics
- motor and somatosensory function



### Restore

- minimally-supervised therapy & assistance
- wearable robotics & neuroimaging



**RELAB** Engineering for Independence

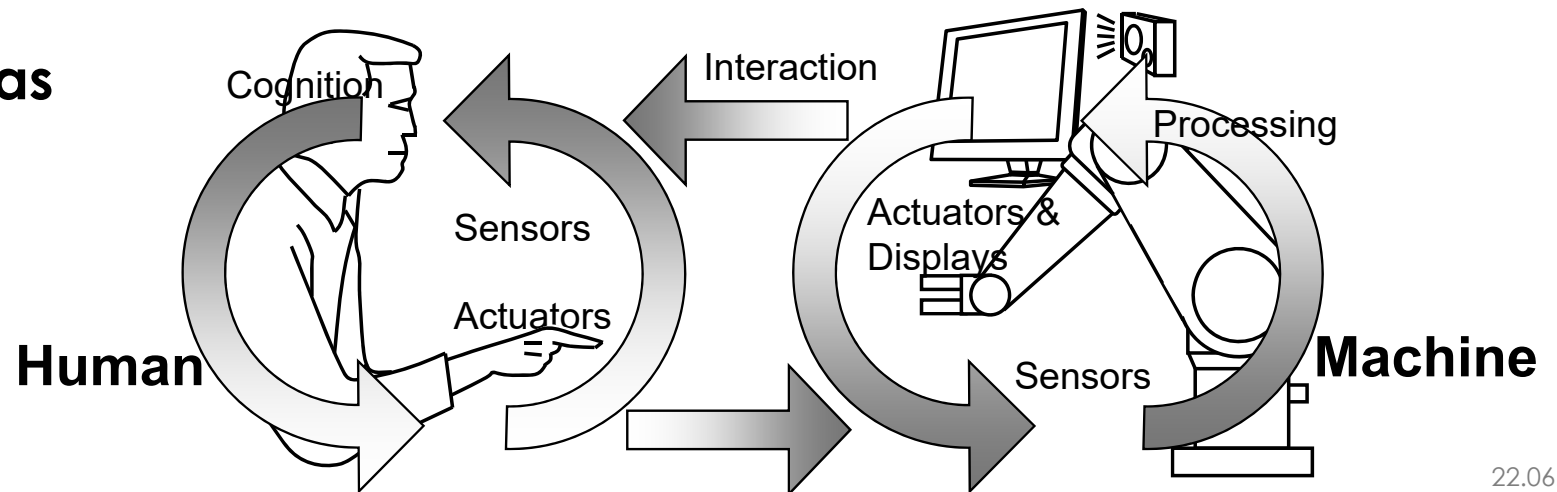
## Prof. Dr. Robert Riener



### ► Affiliations:

- D-HEST, ETH Zurich
  - Institute of Robotics and Intelligent Systems
  - Sensory-Motor Systems Lab
- Medical Faculty, University of Zurich
  - University Hospital Balgrist, Zurich

### ► Research Areas



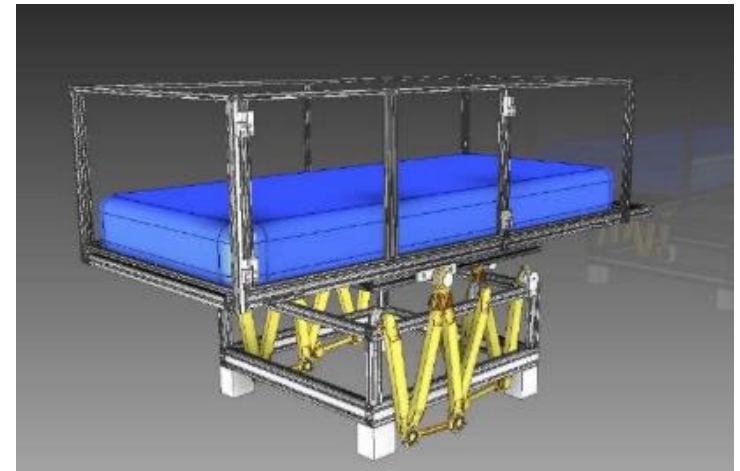
## Research Projects

### Rehabilitation Robotics



### Wearable Exoskeletons

### Somnomat for improved sleep



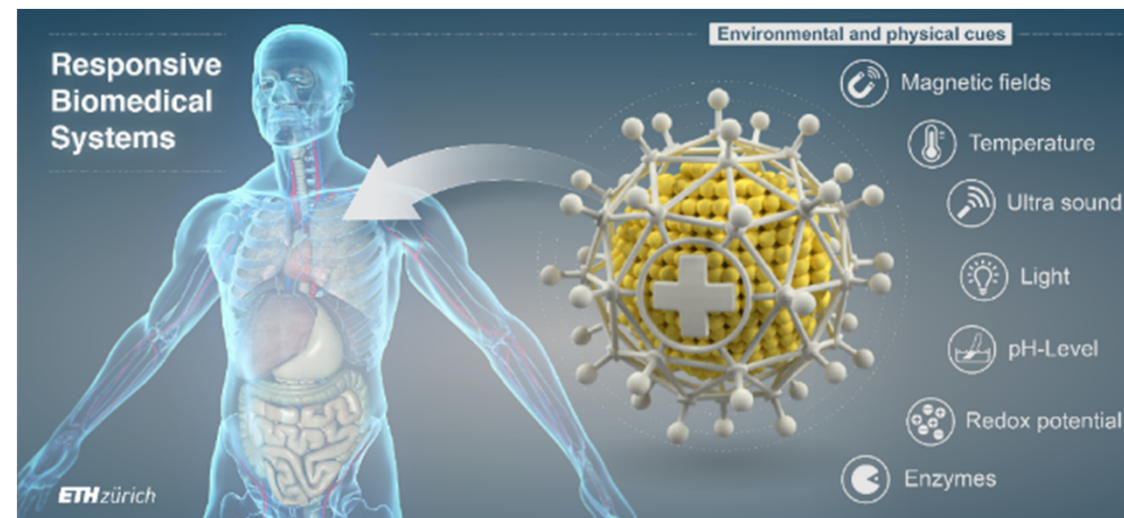
## Prof. Dr. Simone Schürle

### ► Affiliation:

- D-HEST
  - Institute of Translational Medicine
  - Responsive Biomedical Systems Laboratory

### ► Research Areas

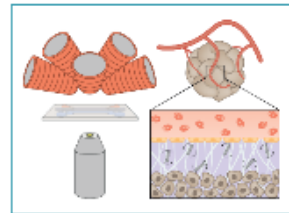
- Design and Fabrication of micro- and nanosystems
  - Diseases diagnostics
  - Localized therapeutic delivery
  - Therapy monitoring
- Engineering of companion instrumentation for signal transduction and processing



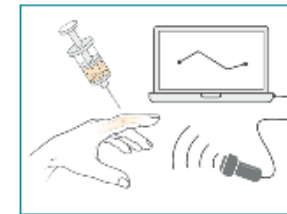
## Examples of a Research Projects

**Remote control of microrobots in tissue to probe and sense local biomechanics**

**MICROBOTICS FOR MECHANOSIGNALING IN TISSUES**



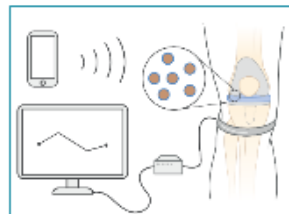
**NANOSENSORS FOR ARTHRITIS DIAGNOSTICS**



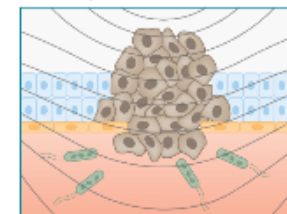
**Inductance and acoustic-based detection of micro- and nanosensors as reporters for early stages of arthritis**

**Wireless detection of local infections through smart implant coatings**

**IMPLANT MONITORING**



**BACTERIAL CANCER THERAPY**



**Swarm control of magnetic bacteria for cancer therapy**