

Robot Brains

Prof.dr. R. Babuška

Intelligent Control & Robotics

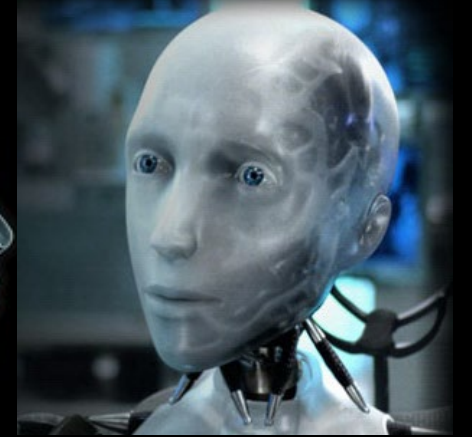
14 January 2011

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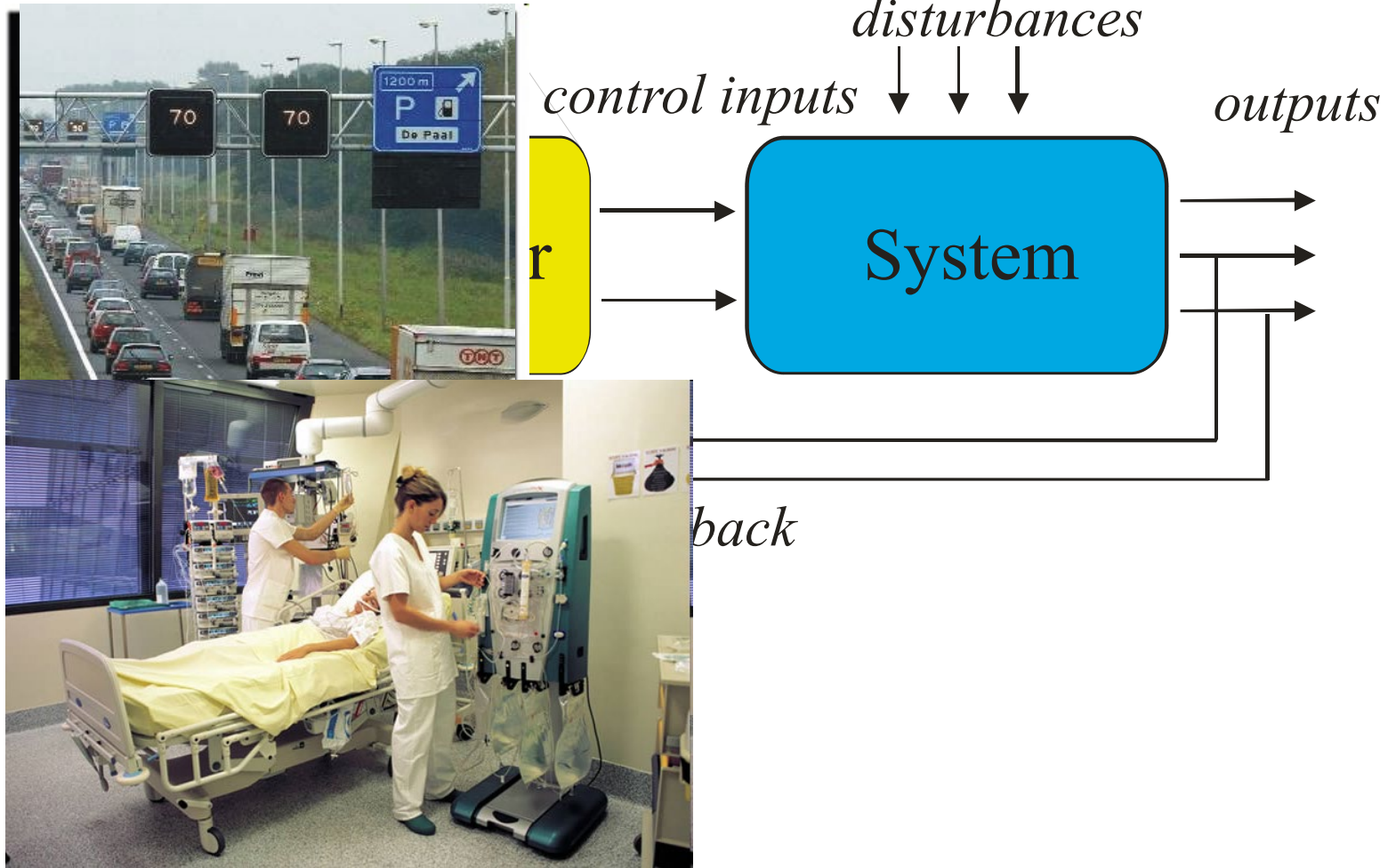
Intelligent Control & Robotics

14 January 2011

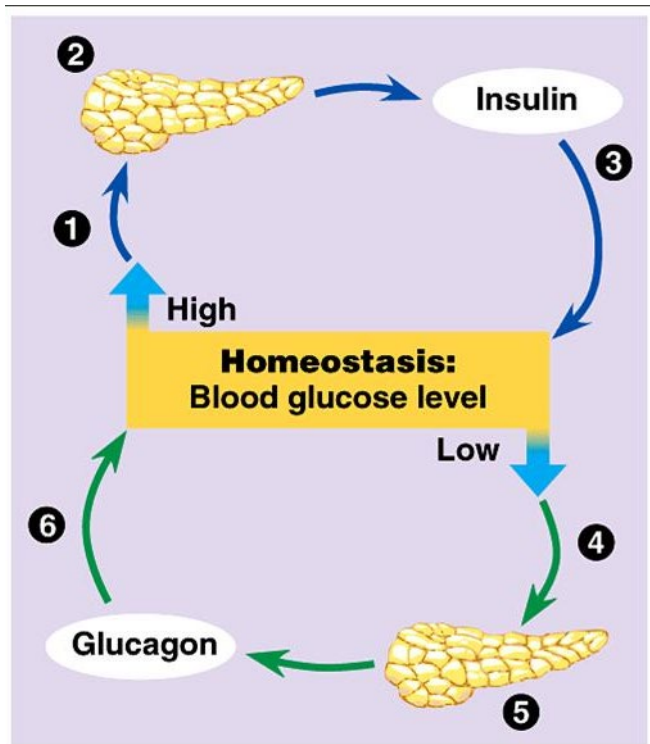


- Systems and control
- Challenges in robotics
- Intelligent control

Automatic Control



Feedback in Nature



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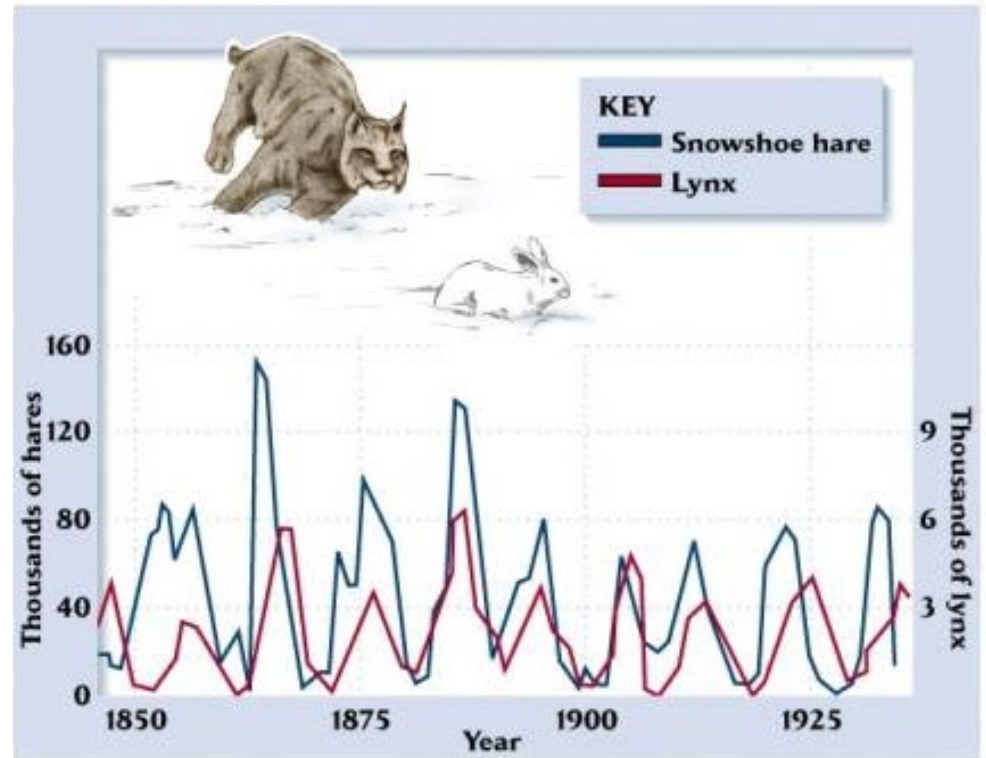
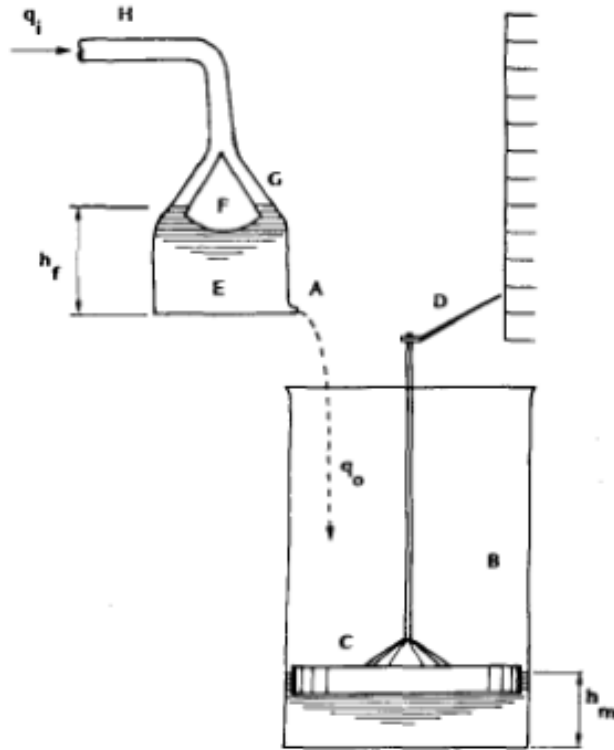
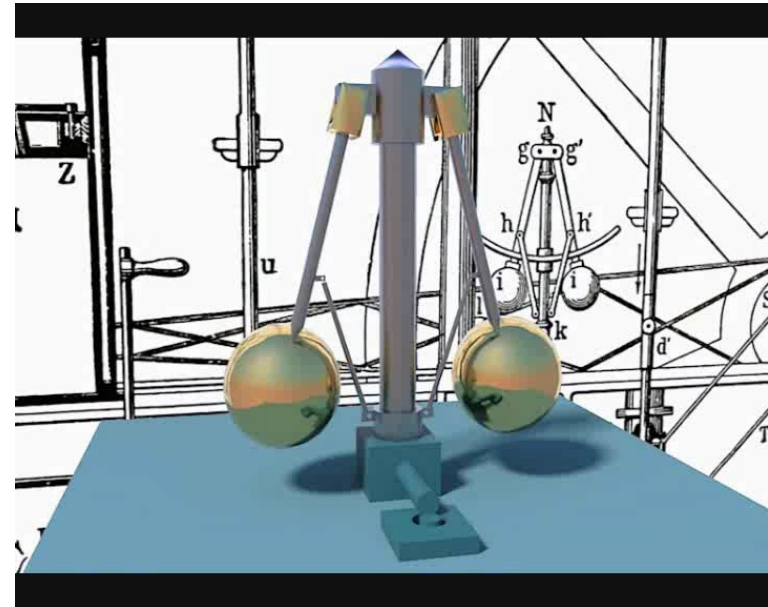


Image source: mathnathan.com

First Man-Made Control Systems

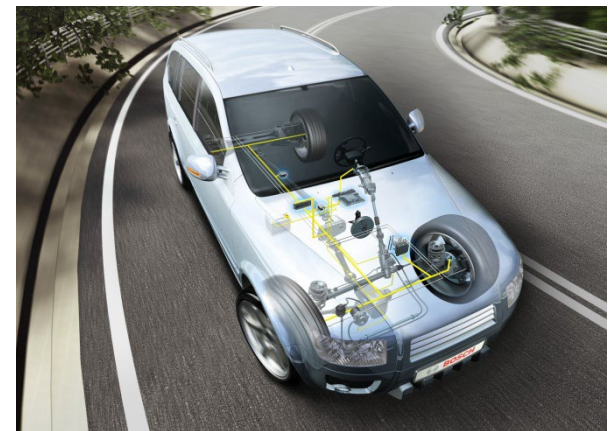
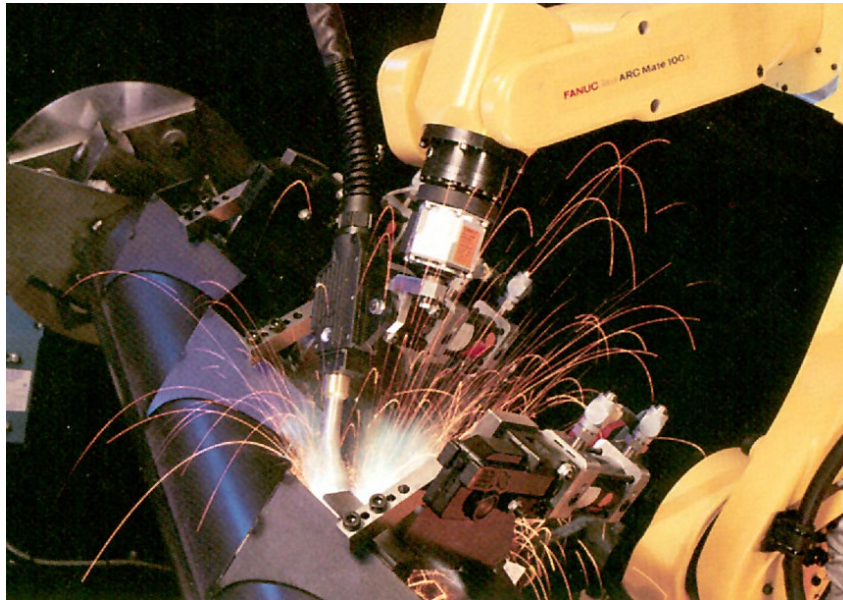
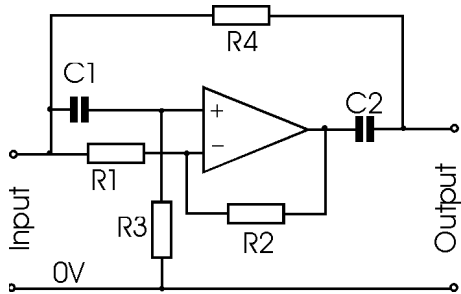


Ancient water clock by Ktesibios
Alexandria 3rd century BC

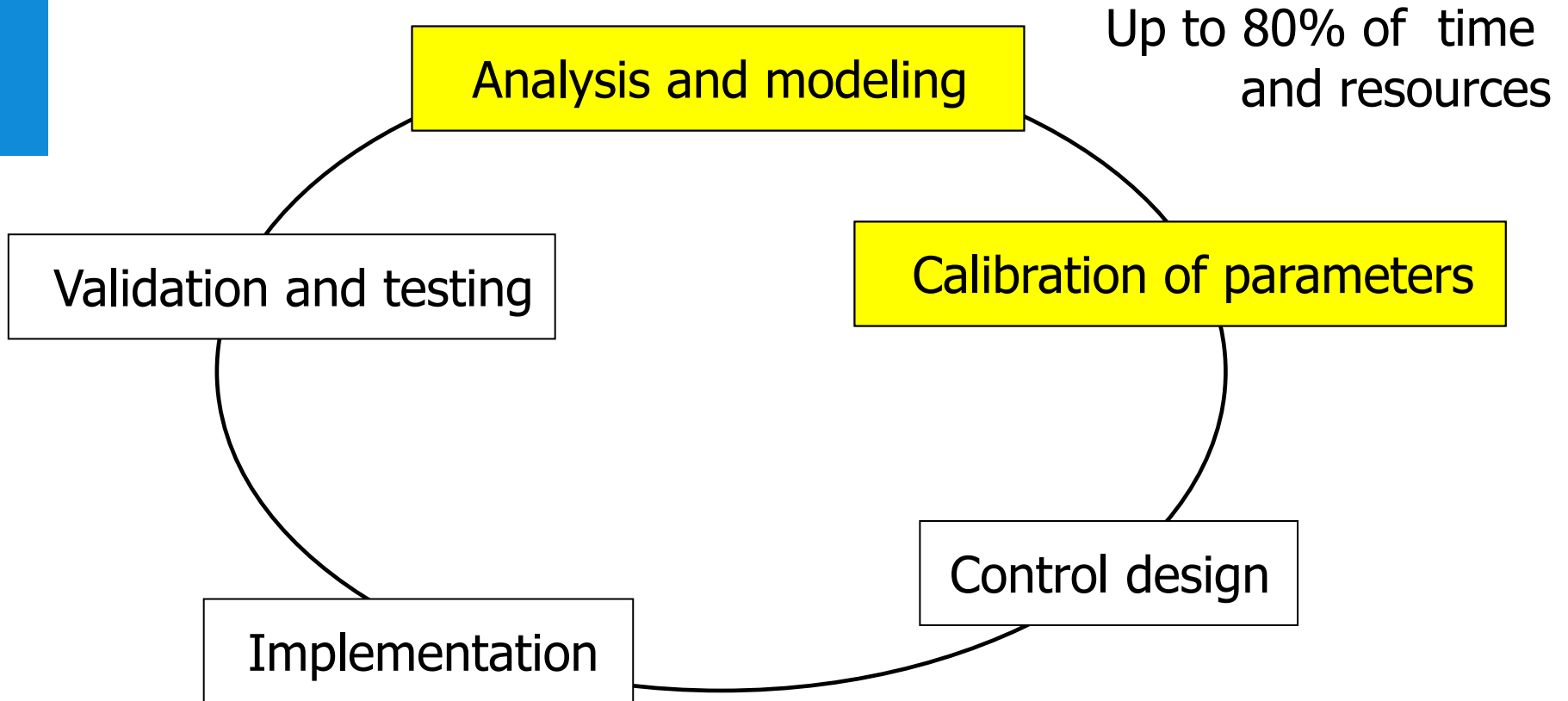


Steam engine speed regulator
James Watt, Scotland 1788

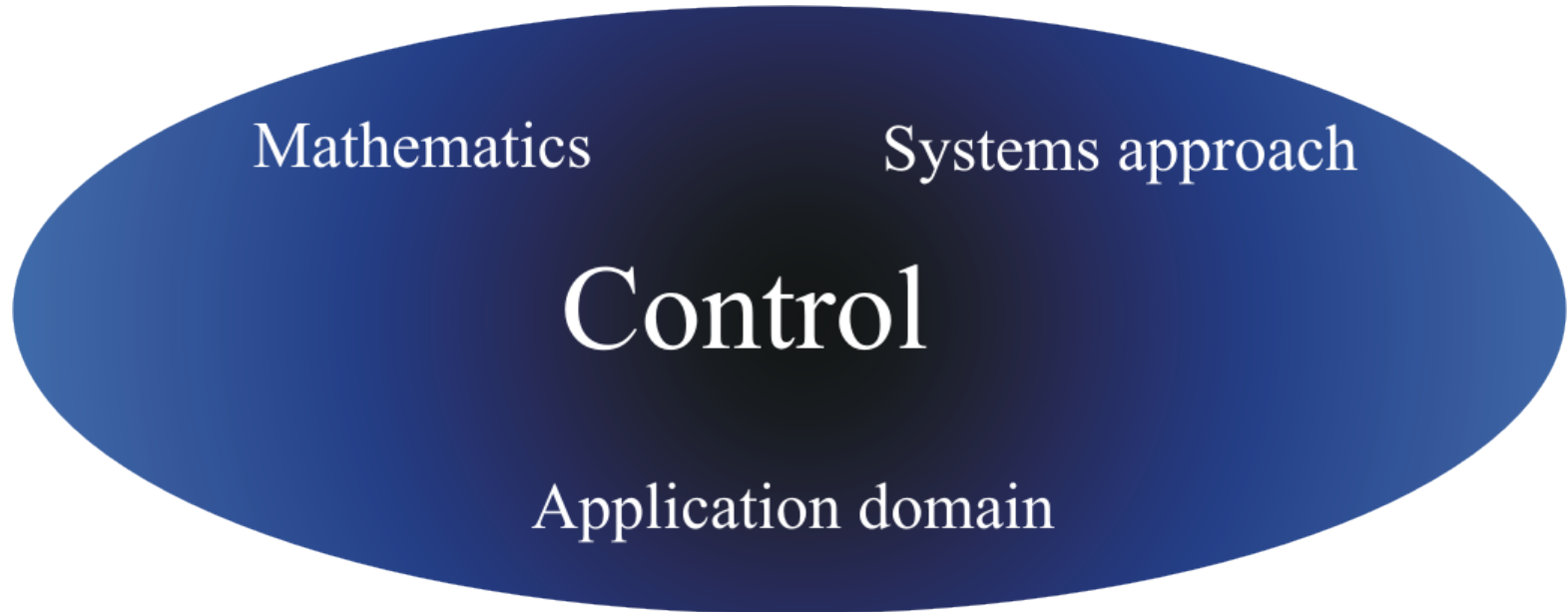
Huge Impact of Invisible Technology



Model-Based Design



Cornerstones of Control Research



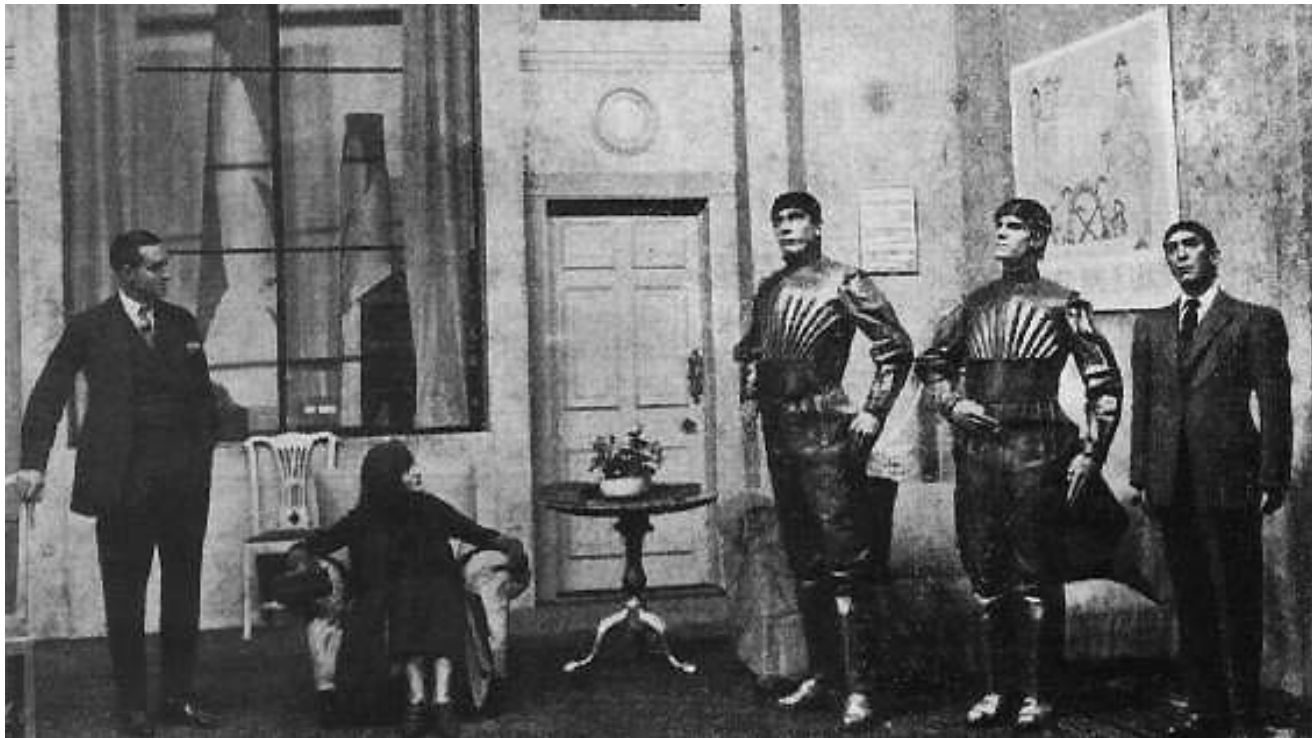
Emphasis on provably correct design
- stability and performance guarantees

Robotics

Robot

– a mechanical system which performs tasks under human control, in collaboration with humans or autonomously

from Czech "robota" – forced labor (Karel Čapek's play R.U.R., 1921)



Robotics

Great impact in **well structured, engineered environments**

- speed, accuracy, repeatability, automatic operation
- *preprogrammed* tasks, *no interaction* with humans



Robotics

Some success in **telemanipulation** and **teleroperation**

- *robots operated by humans*



Robotics

Challenges ahead in **domestic, service and care applications**

- operate autonomously and interact with humans



Robotics

Challenges ahead in **domestic, service and care applications**

-operate autonomously and interact with humans



video source: youtube

Robotics

Challenges ahead in **domestic, service and care applications**

- operate semi-autonomously and interact with humans



Robotics

Challenges ahead in **domestic, service and care applications**

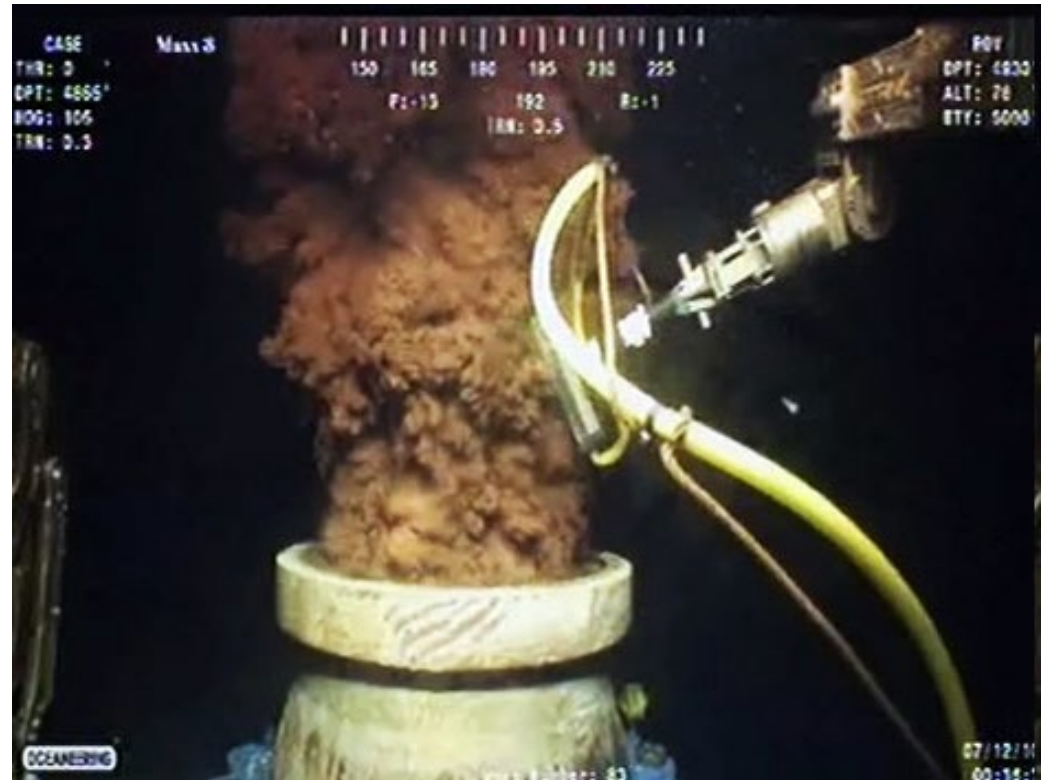
- operate semi-autonomously and interact with humans



Freek Liefhebber (TNO & TU Delft)

Robotics

more challenges: **agriculture, deep sea, construction, ...**



Challenges in Robotics

- safety in human-machine interaction
- autonomy and shared autonomy (collaborate with humans)
- coping with unstructured environments

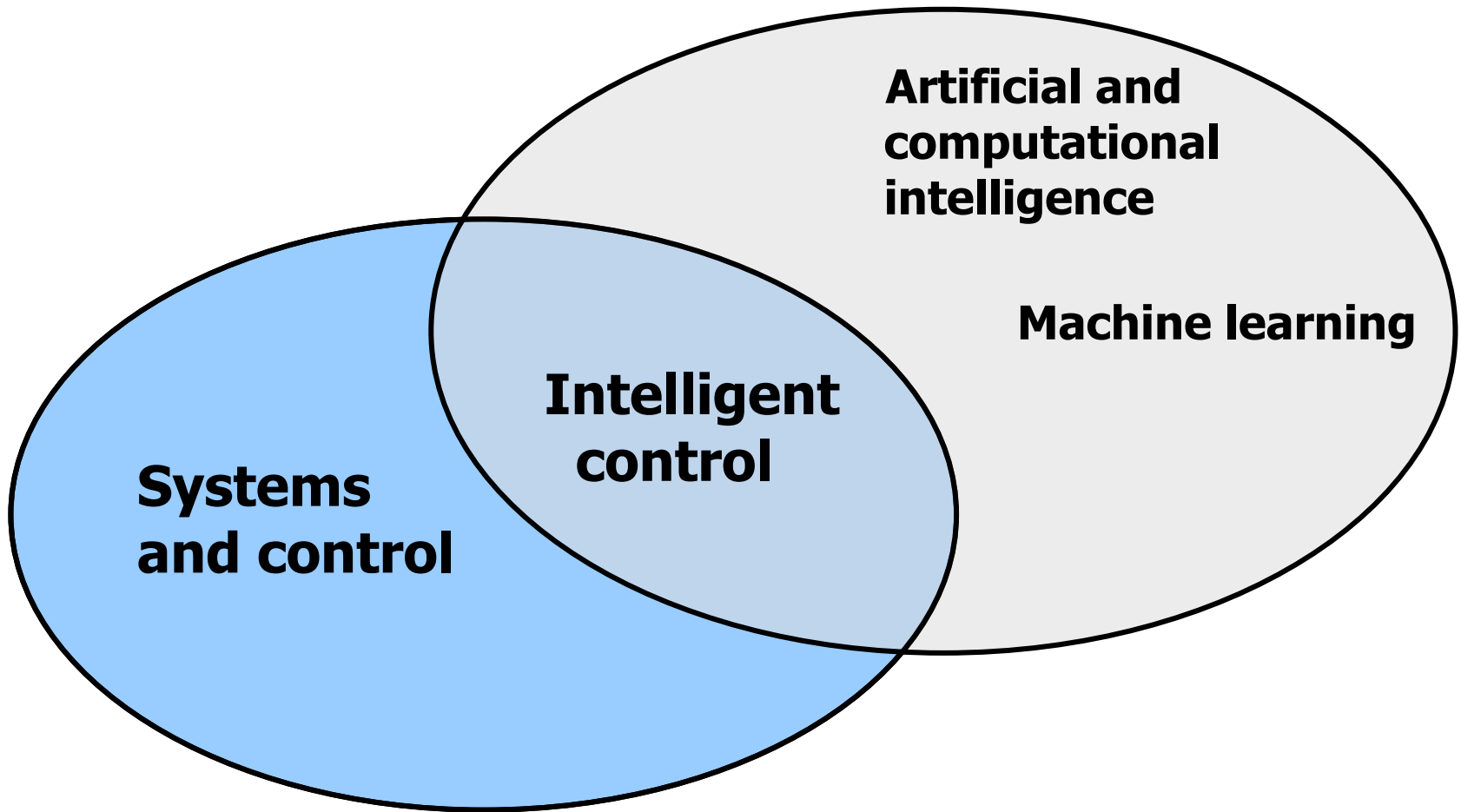


versus



Intelligent Control

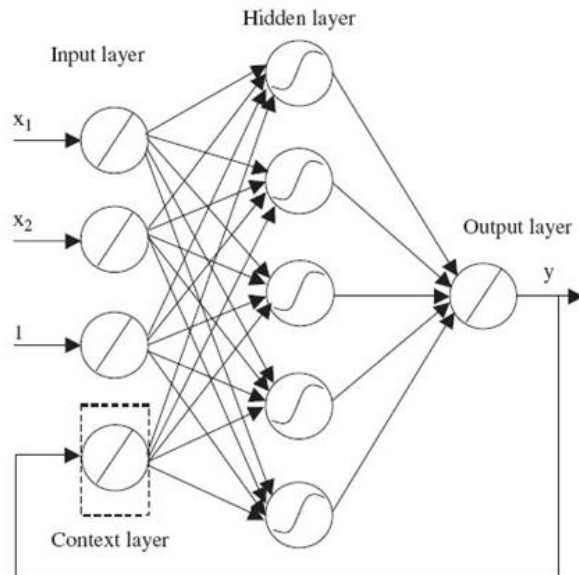
Intelligent Control



Alternative Representation Schemes

Traditional control

$$y(k+1) = A(q)y(k) + B(q)u(k)$$



artificial neural networks

Inspiration in nature



rule-based models

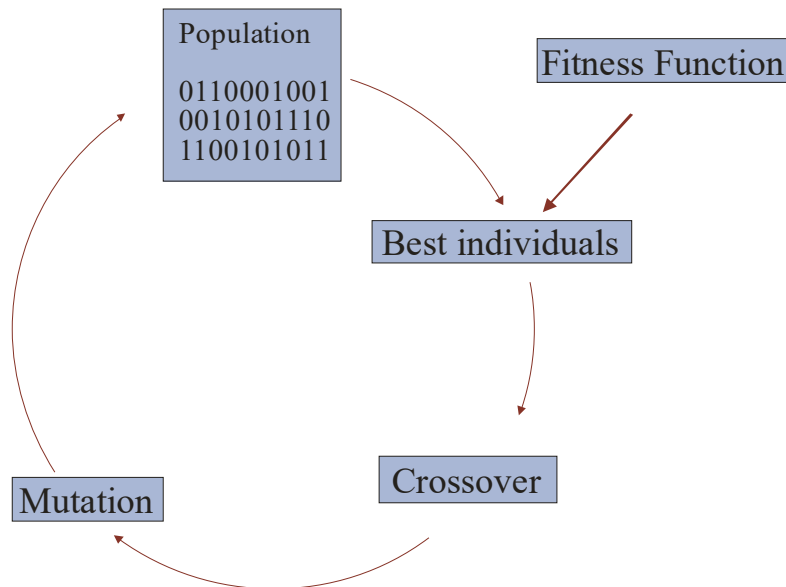
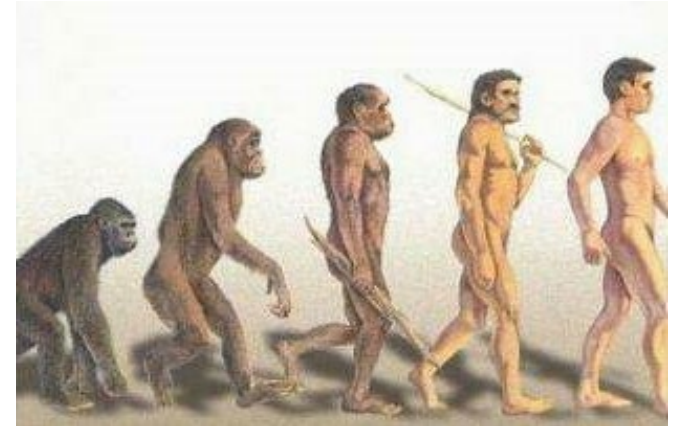
if <condition> then <conclusion>

Optimization in Control

Roots in maths

$$x_{\text{opt}} = \underset{x}{\operatorname{argmax}} F(x)$$

Inspiration in nature



Genetic and evolutionary algorithms

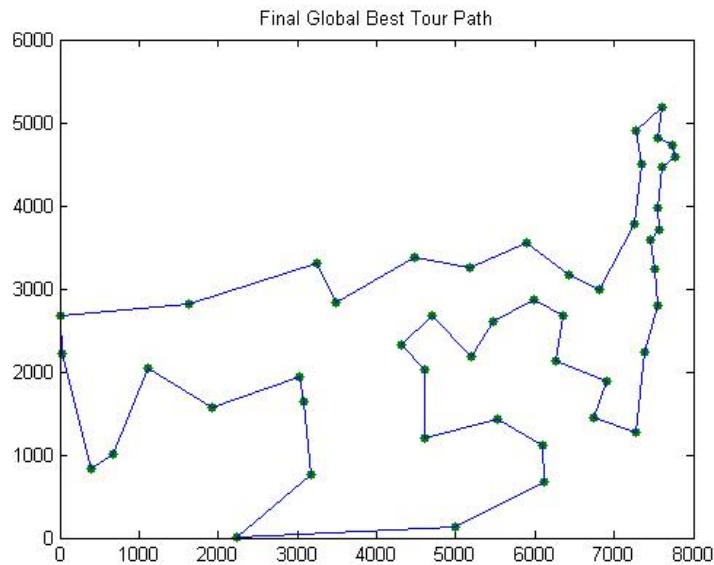
Optimization in Control

Roots in maths

$$x_{\text{opt}} = \underset{x}{\operatorname{argmax}} F(x)$$

Swarm intelligence

Inspiration in nature



Machine Learning

ability to learn a *specific task* from experience, without being specifically programmed for that task

- adapt to changes in environment
- find new, better solutions
- teach by demonstration or imitation

Spectrum of Learning Techniques

Reinforcement learning
(learn directly to control)



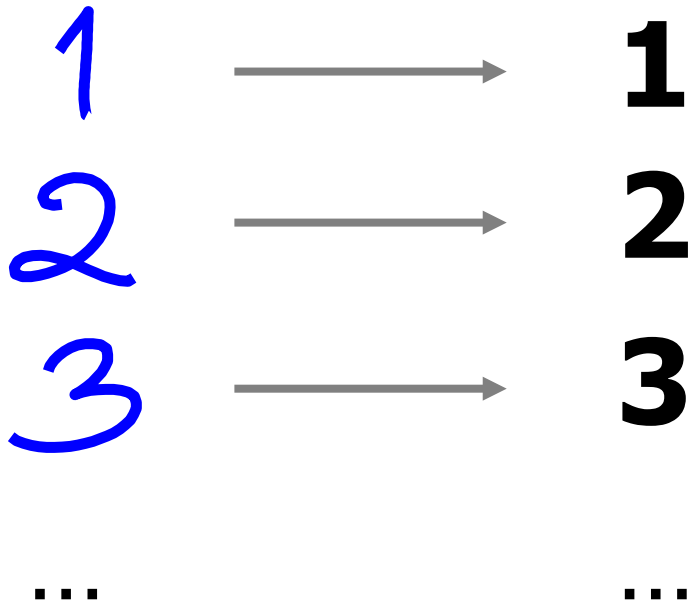
Supervised learning
(with 'teacher')

Unsupervised learning
(without 'teacher')

Supervised Learning: Classification

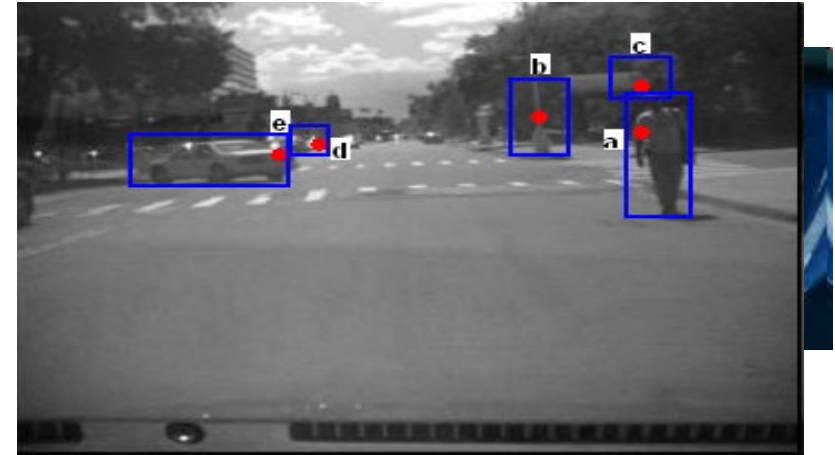
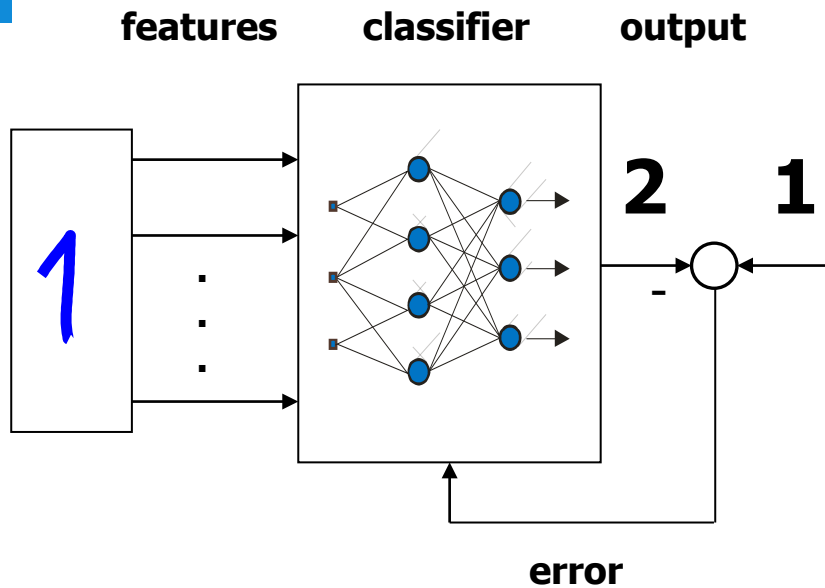
Input pattern

Class



1. Collect a training set

Supervised Learning: Classification



- 1. Collect a training set**
- 2. Train the classifier**
- 3. Use to classify new patterns**

Construct a Robot Model from Data



actuate motors and observe the response

Two ways to model the system:

1. **Physical modeling**
2. **System identification**



Maarten Vaandrager

Spectrum of Learning Techniques

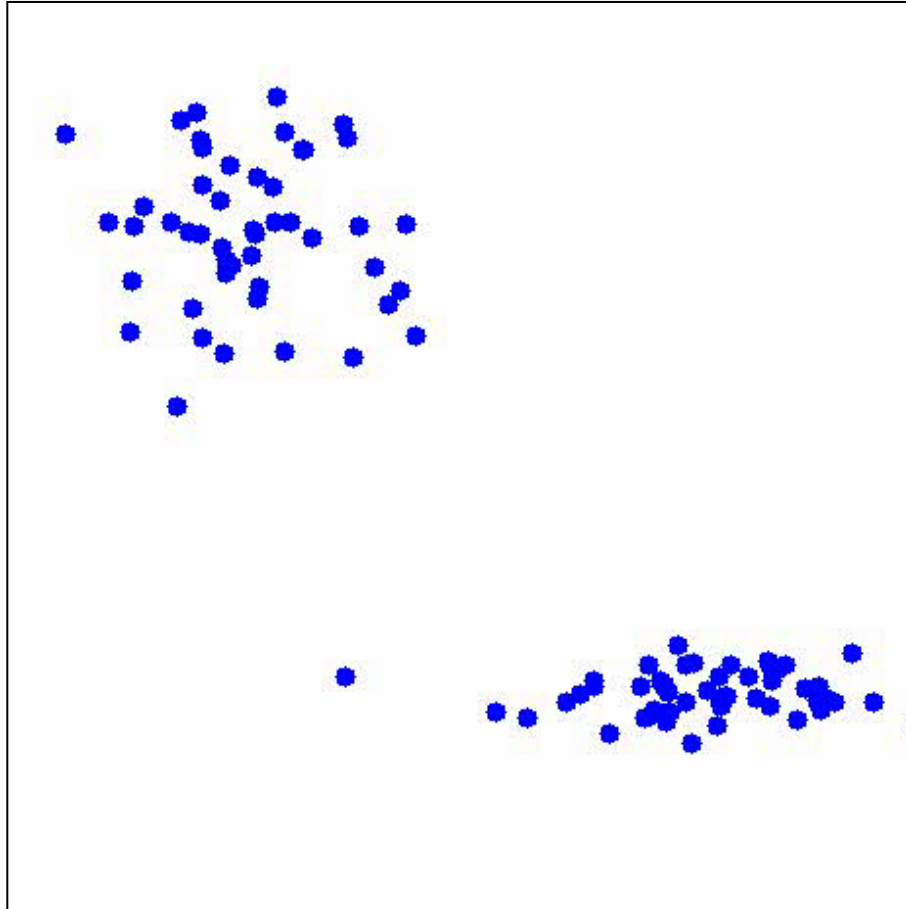
Reinforcement learning
(learn directly to control)



Supervised learning
(with 'teacher')

Unsupervised learning
(without 'teacher')

Unsupervised Learning - Clustering

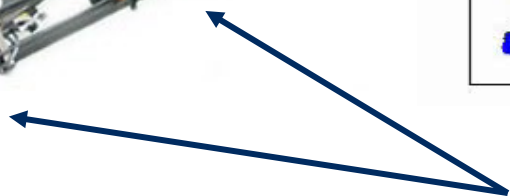
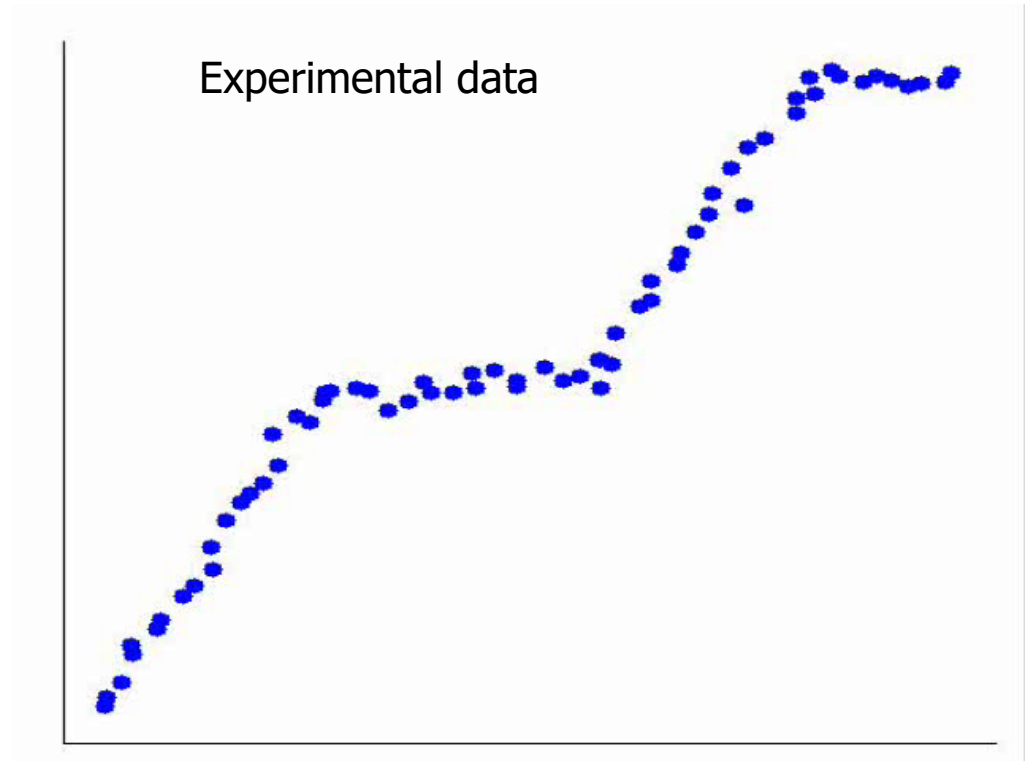


- *Discover automatically groups and structures in data*

Applications:

- Pattern recognition
- Robot perception, vision
- Data-driven construction of dynamic models

Construction of Nonlinear Models



Nonlinear and uncertain behavior

Spectrum of Learning Techniques

Reinforcement learning
(learn directly to control)

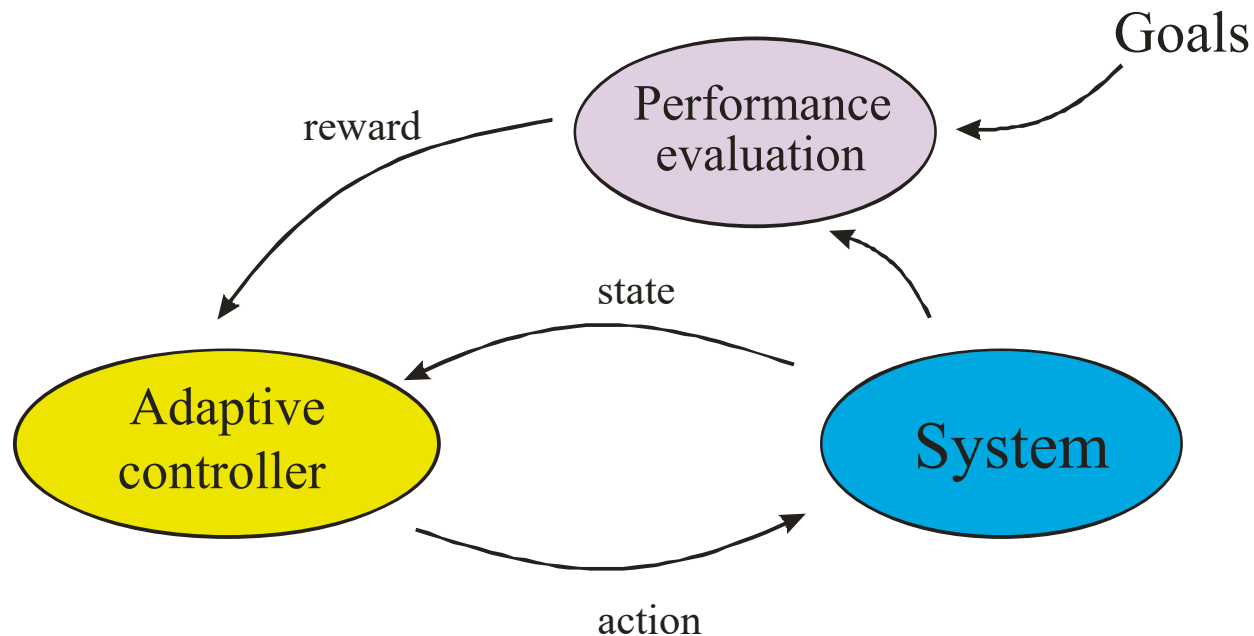


Supervised learning
(with 'teacher')

Unsupervised learning
(without 'teacher')

Reinforcement Learning

Inspiration - animal learning (reward desired behavior)



Goal:

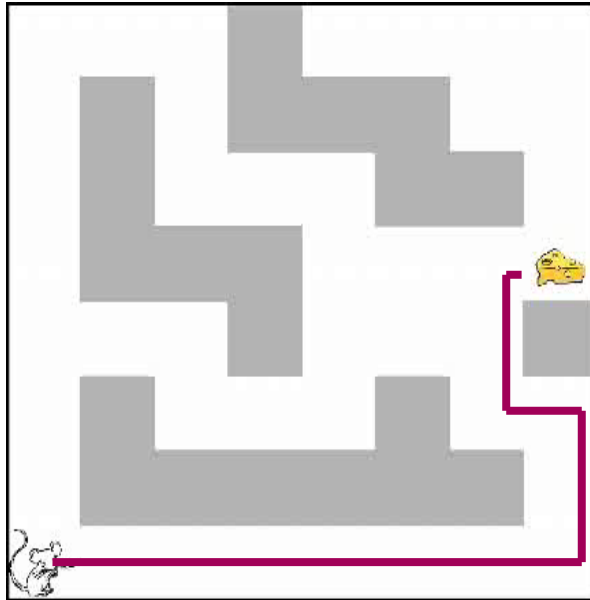
Adapt the control strategy so that the sum of rewards over time is maximal.

Reinforcement Learning

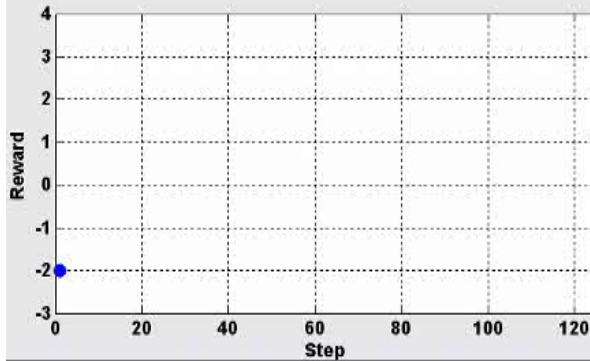
Inspiration - animal learning (reward desired behavior)



Example - Learning Optimal Path



Reward position
(goal not yet reached,
energy consumed)

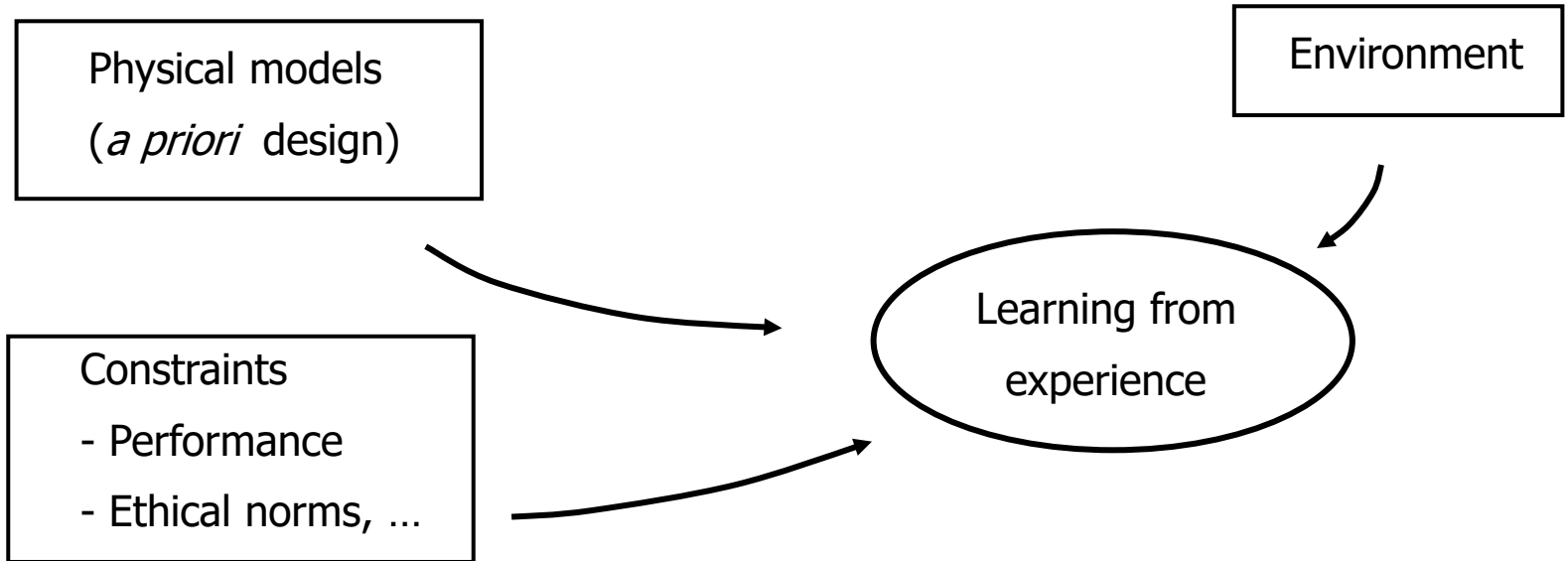


Learning in Real World, in Real Time

Reinforcement learning
using experience replay
for the robotic goalkeeper

Initial trials: bad performance

Long-term Research Goal



Precocial

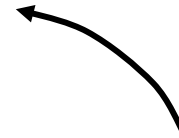


Altricial



Robot Control: Traditional View

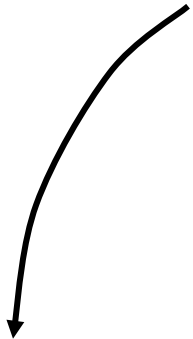
Task control



Perception, situation awareness



Motion control



Integrated Robot Control

Task control



Perception, situation awareness

Motion control

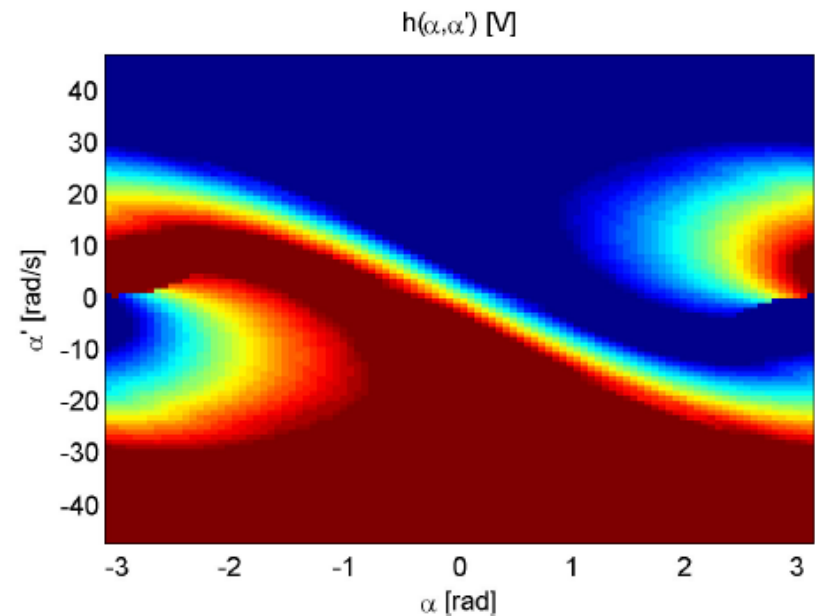
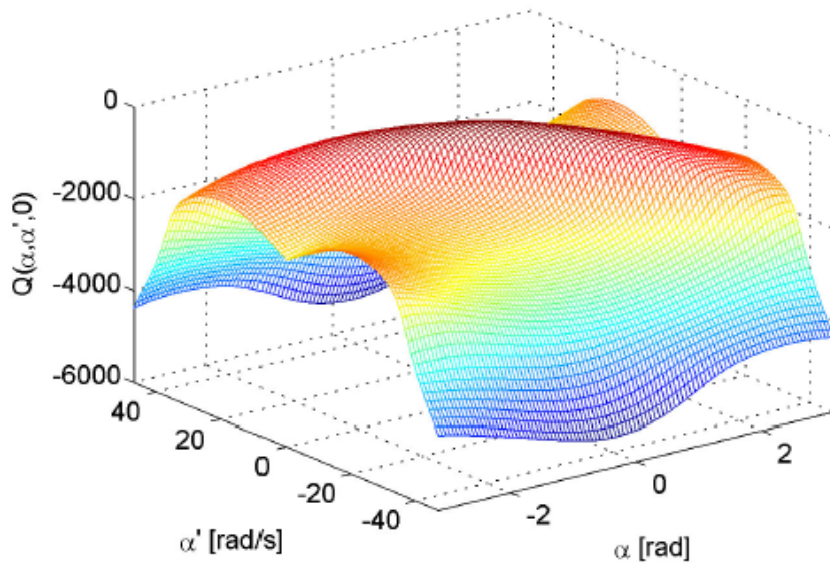
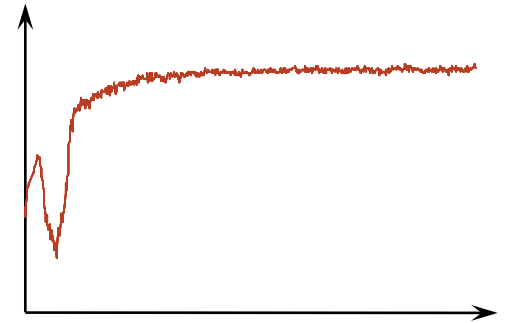


- Interaction
- Learning at all levels
- Robot teams

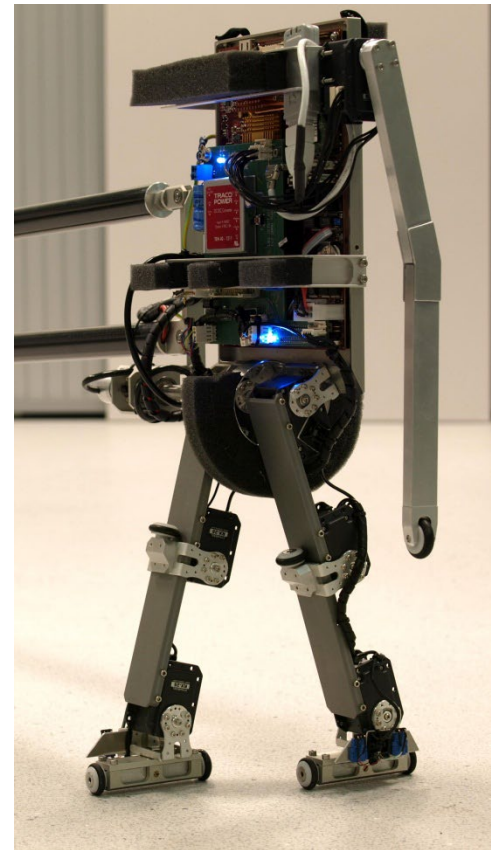
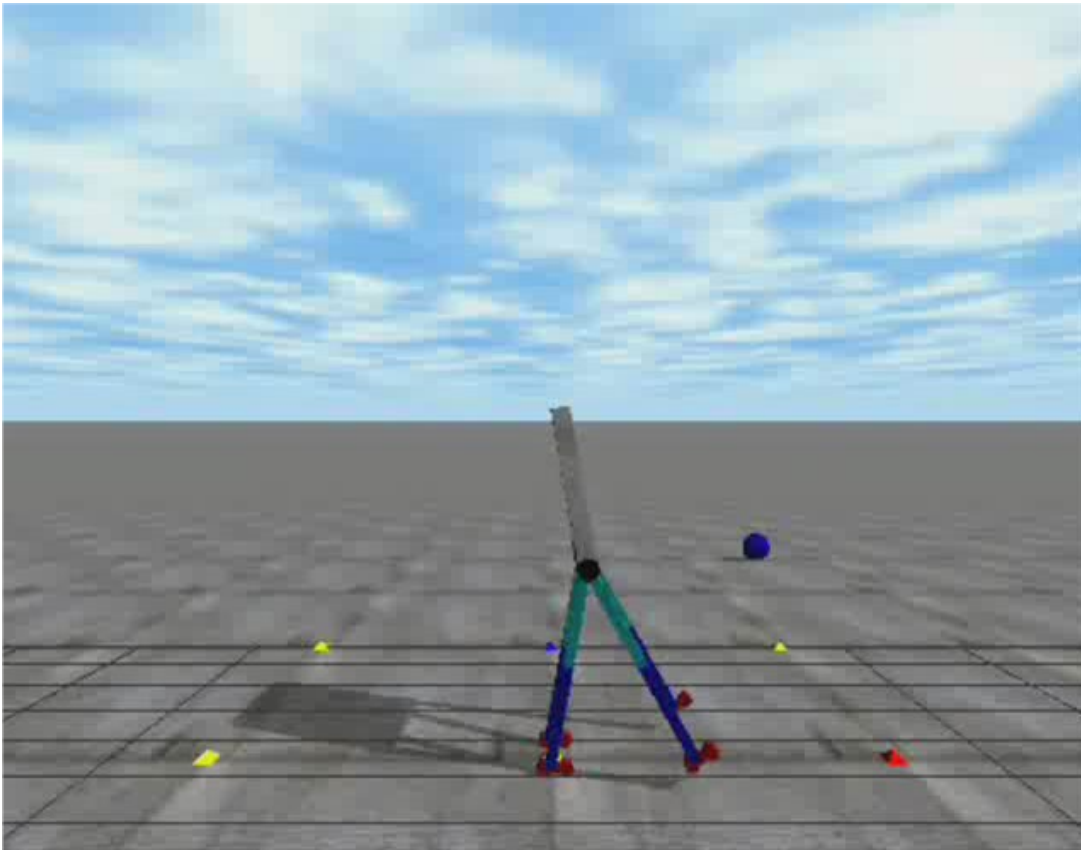
Research Themes

Reinforcement Learning for Control and Planning

- Approximation in high-dimensional continuous spaces
- Computationally effective methods
- Constrained learning and convergence



Reinforcement Learning for Bipedal Locomotion

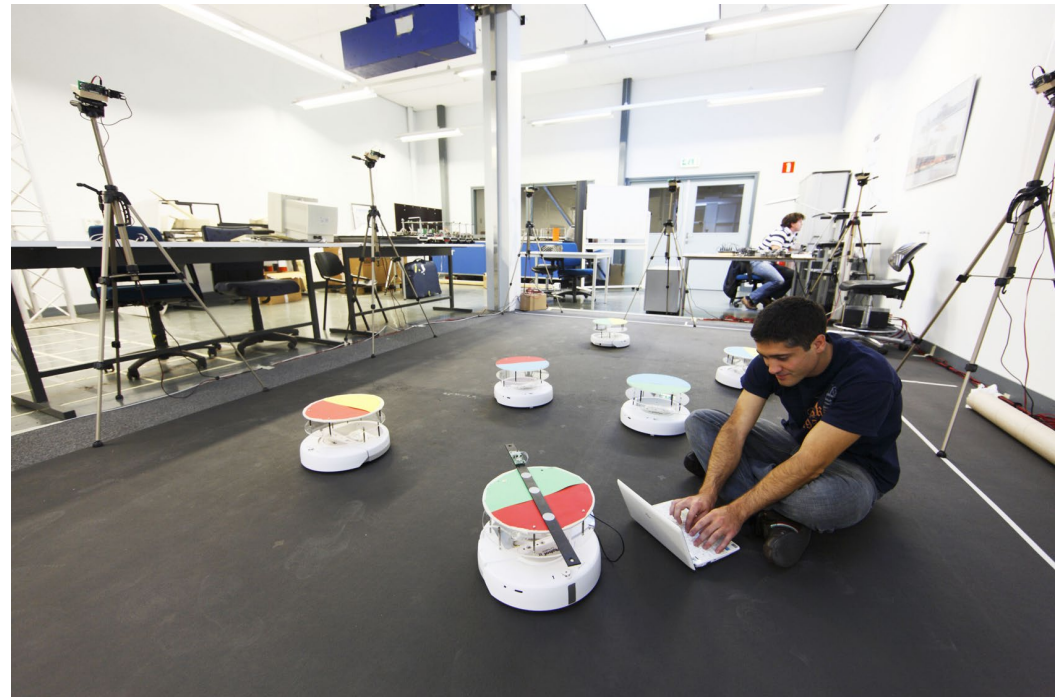


E. Schuitema (collaboration with the Biorobotics Lab, TU Delft - M. Wisse and P. Jonker).

Research Themes

Filtering, estimation and adaptive control

- Distributed filtering and localization
- Nonlinear adaptive methods
- Stochastic estimation



Andrea Simonetto and Tamas Keviczky

Research Themes

Legged locomotion

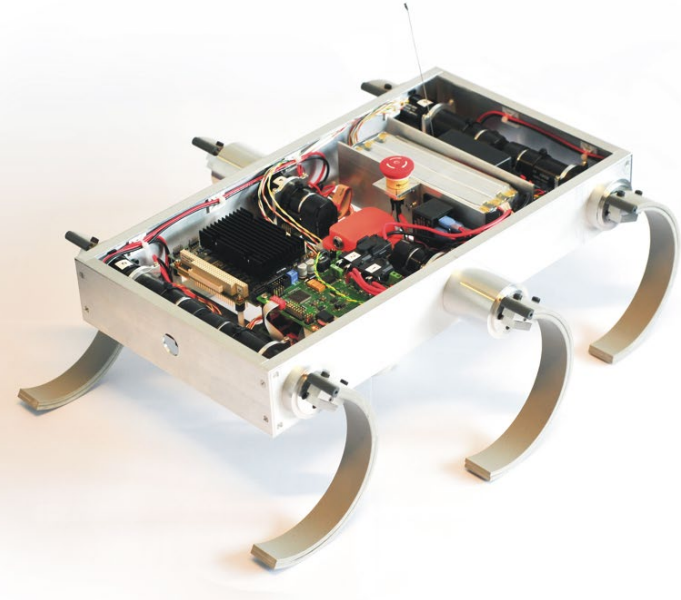
- Gait generation
- Learning and optimization

Robotic manipulators

- Task-oriented control
- Adaptive payload estimation

Software and hardware

- Automatic code generation
- Development of infrastructure



Gabriel Lopes & DCSC engineering team

Integrated Robot Control

Task control



Perception, situation awareness

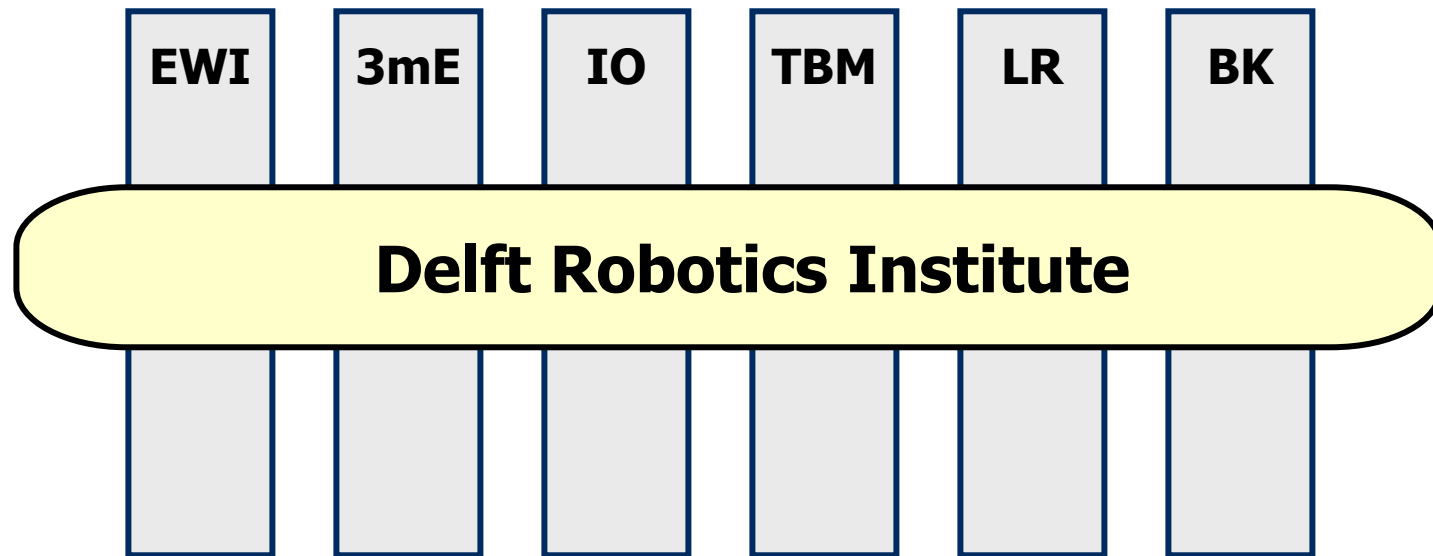
- Interaction
- Learning at all levels
- Robot teams

Motion control



Coordinated multi-disciplinary research!

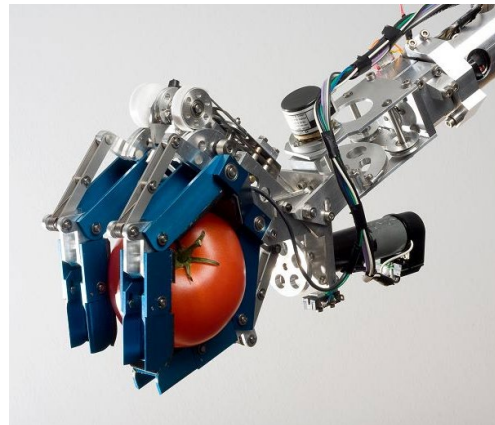
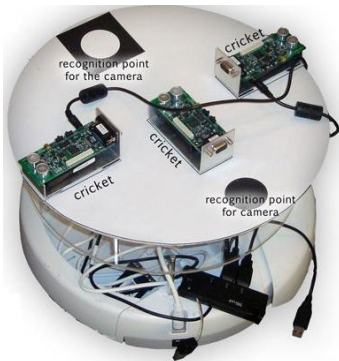
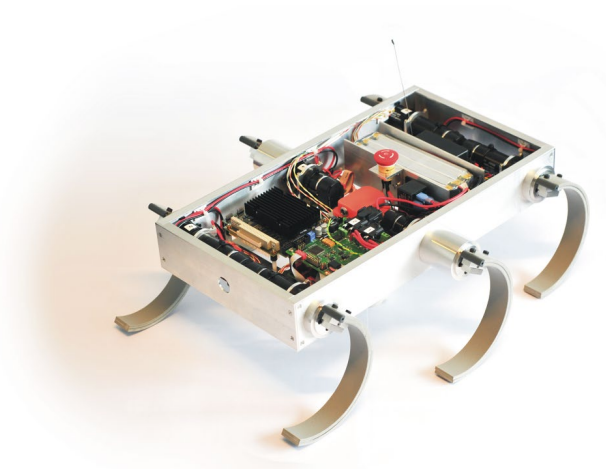
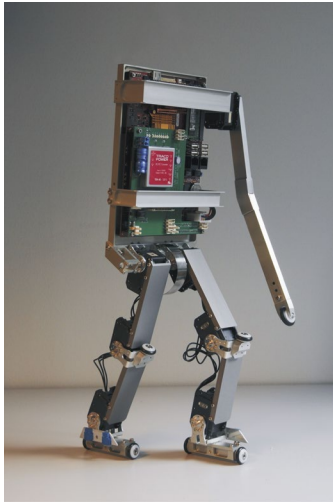
Robotics @ TU Delft



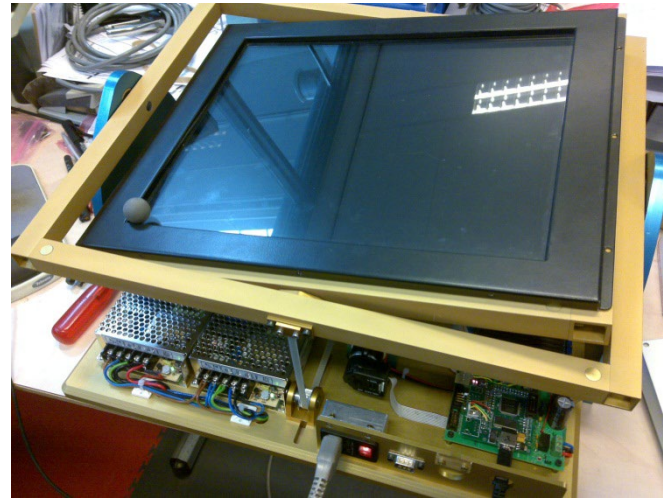
Goal: advance robotics research, education and valorization in a coordinated fashion.

Mechanics, electronics, design, control, sensing, vision, human-robot interaction, ...

Research Platforms



Educational Platforms



Robotics in the Dutch Context

disc dutch institute
of systems
and control



Acknowledgements

- University board
- Dean of 3mE, Prof. Marco Waas
- Rector Magnificus, Prof. Karel Luyben
- My teachers, mentors, colleagues and students

Special Thanks to

Henk Verbuggen (emeritus professor)



Biggest Thanks to

Dana, Markéta and Míša





Hard Disk Read/Write Head Control



- high-speed, high-precision positioning of the arm
- closed system, little interaction with environment

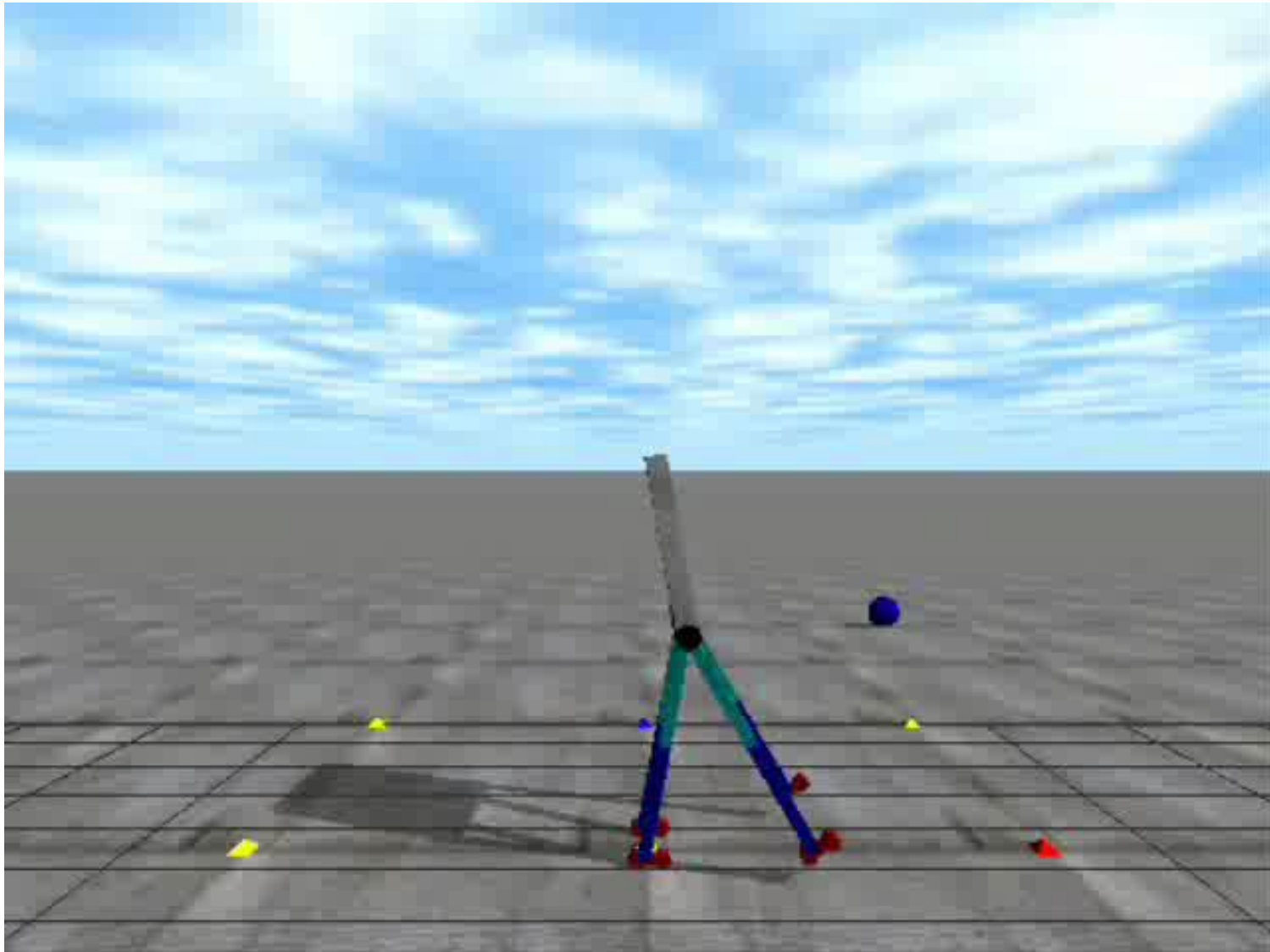




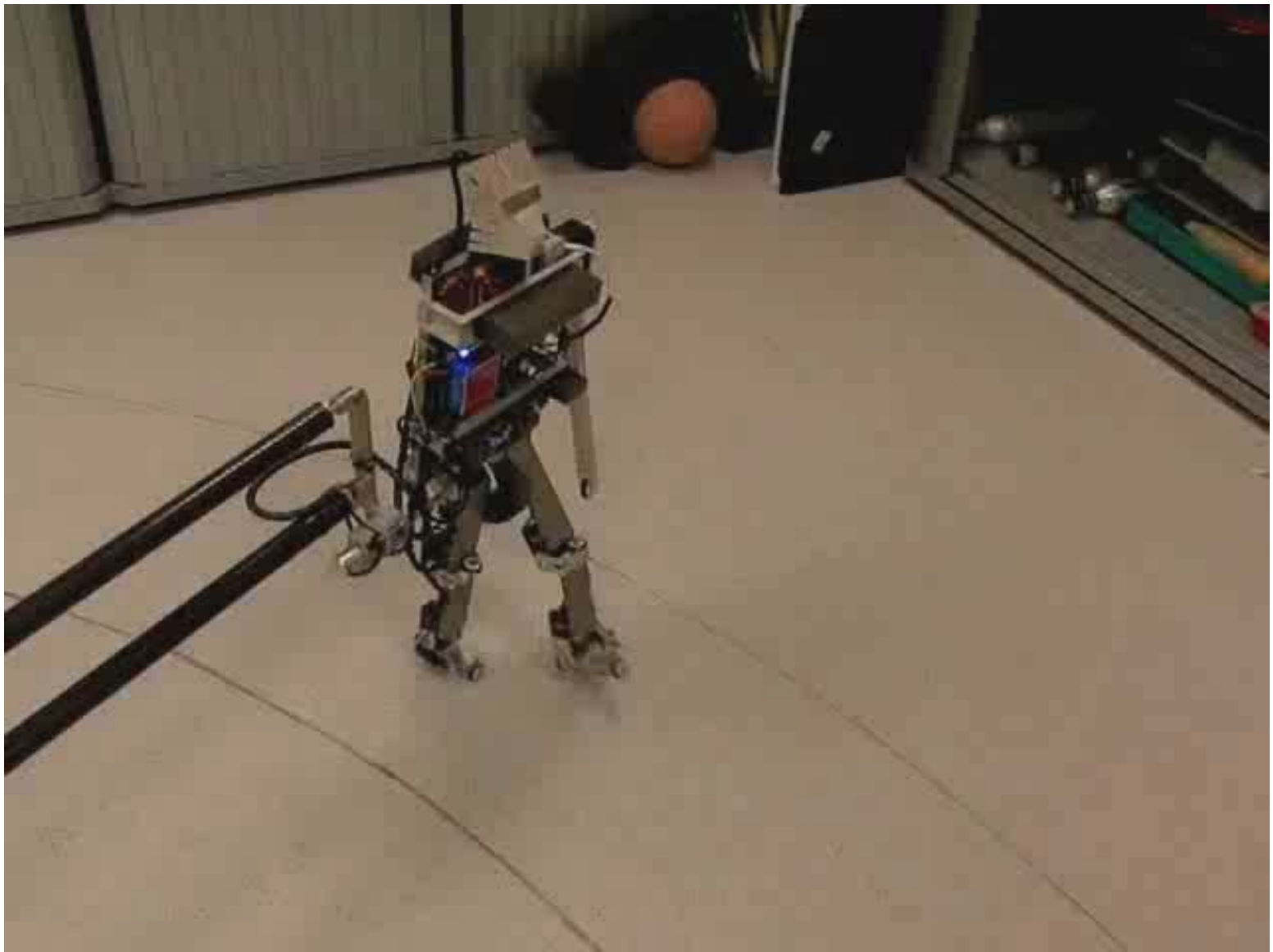
Harvesting Robot



- high-speed, high-precision, gentle handling
- open system, interaction with environment is crucial



E. Schuitema, M. Wisse and P. Jonker



E. Schuitema



RHex project, USA

Possible Convergence Curve

