

# ADAPT – UNIZH Past-Present

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## Morphology, Materials, and Control “Developmental Robotics”

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Department of Information Technology  
University of Zurich  
Switzerland

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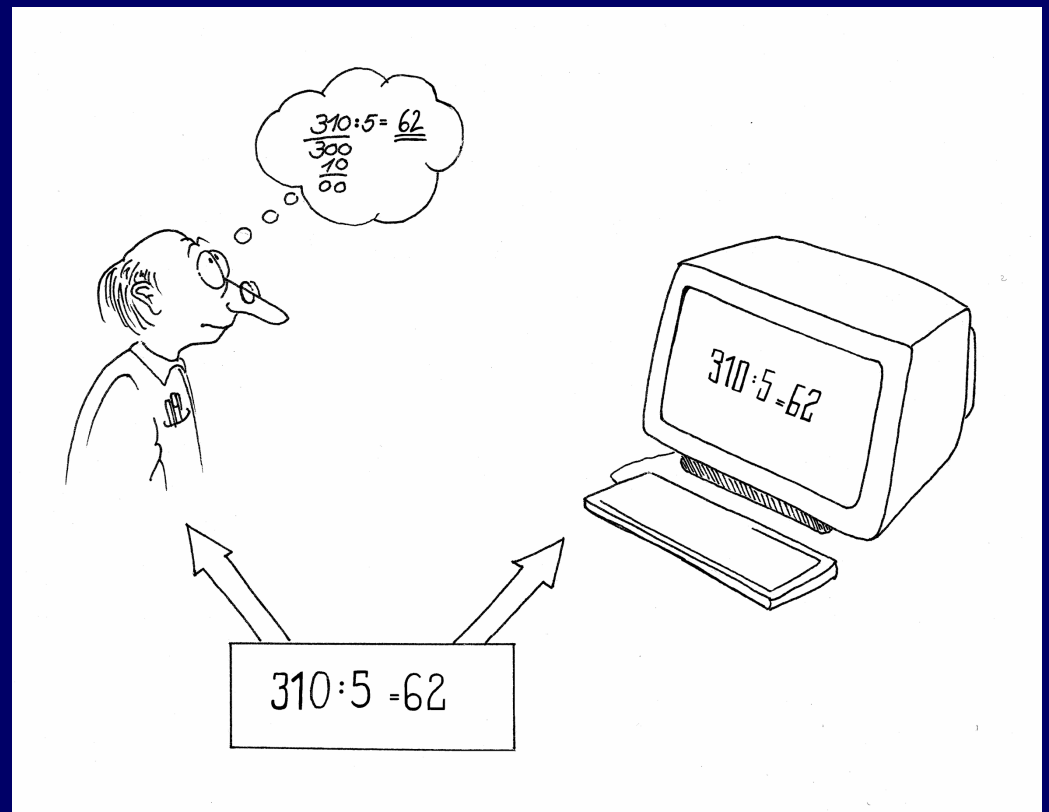
- Introductory comments
- Zurich AI Lab research overview
- The synthetic methodology
- Embodiment – illustrations
- A hard problem in cognitive science: perception in the real world
- The evolution of intelligence: morphogenesis
- The „Zen of robot programming“

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# The cognitivist paradigm



*cognition as computation*

# Artificial intelligence: classical view

Intelligence as:

- centralized in the brain
- as algorithms
- thinking, reasoning, problem solving
- abstraction from physical properties



*the computer metaphor*

*cognition as computation*

# Classical artificial intelligence – successes

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- search engines
- text processing systems
- appliances (dish washers, cameras)
- cars (fuel injection, breaking systems)
- control systems (elevators, subways)
- etc.

# Classical artificial intelligence – failures

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- vision/perception in the real world
- manipulation of objects
- motor control
- common sense
- everyday natural language
- in general: natural forms of intelligence

→ ***cognitive robotics***



# Some problems of classical artificial intelligence

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## *Main problems in a nutshell*

- Neglect of fundamental differences of real worlds and virtual (formal) worlds
- Neglect of nature of agent-environment interaction

# Embodied artificial intelligence

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*Rodney Brooks (MIT Artificial Intelligence Laboratory)*

- distributed through organism-environment
- complete physical agents interacting with the real world
- acquisition of information through sensory system



# Research at the AI Lab in Zurich



*education*

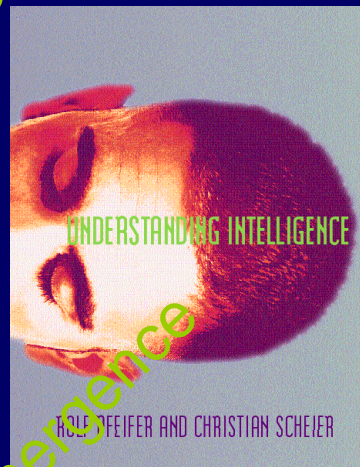
**locomotion and orientation**



*exploitation of passive dynamics*

*medicine*

**collective intelligence**



**learning, development  
neural modeling**

*from structure to growth*



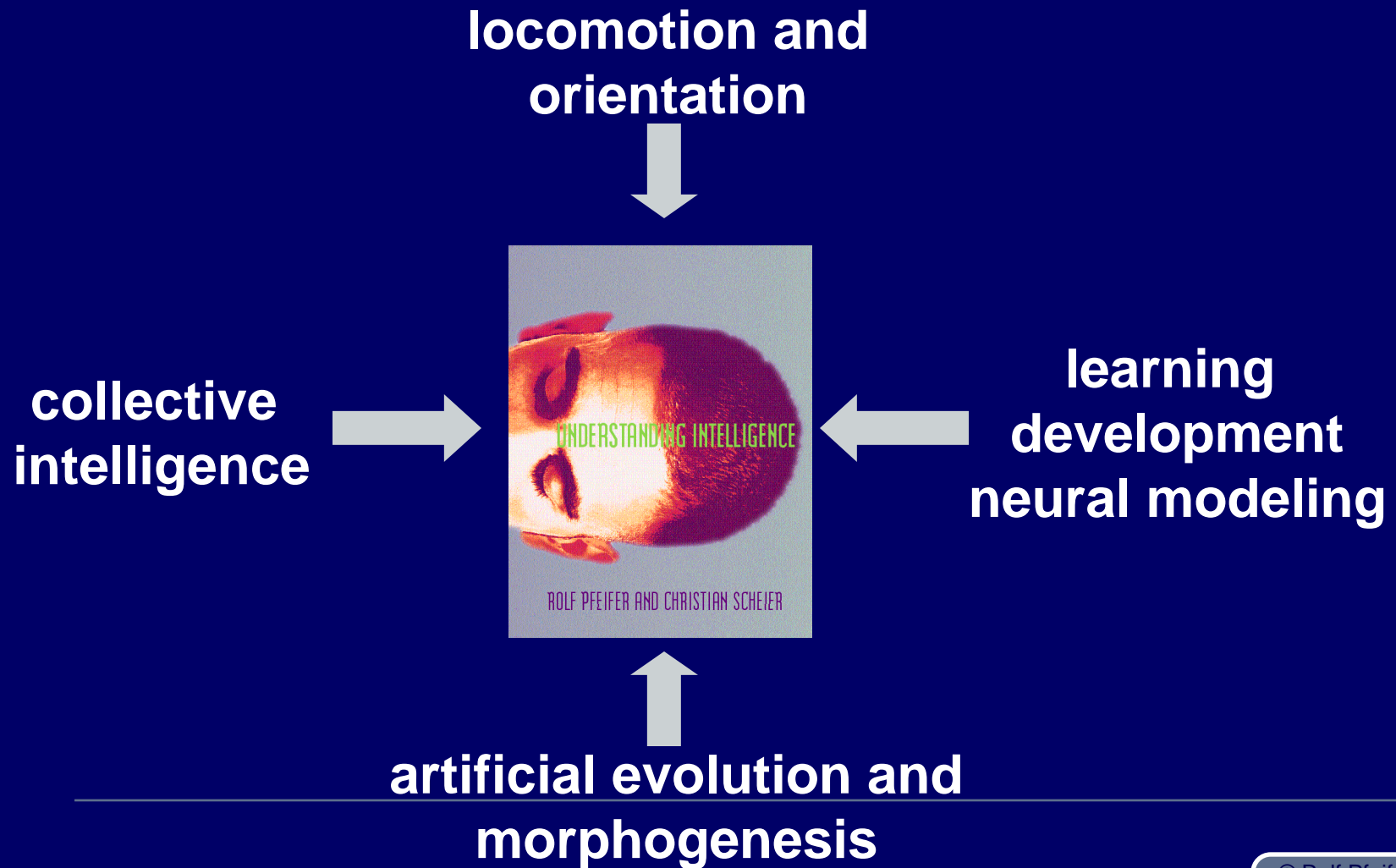
*design and art*

**artificial evolution and morphogenesis**



*entertainment*

# Research at the AI Lab in Zurich



# Some problems of classical artificial intelligence

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## *Main problems in a nutshell*

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# Cognitive robotics

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- cognitive vs. non-cognitive (sensory-motor, emotional)
- continuous (not all-or-none)



# Cognitive robotics

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- cognitive vs. non-cognitive (sensory-motor, emotional)
- continuous (not all-or-none)

—> danger: cognitivistic paradigm lurking!

# Cognition defined

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- „A broad (almost unspecifically so) term which has been traditionally used to refer to such activities as thinking, conceiving, reasoning, etc.“ *The Penguin Dictionary of Psychology*
- „The act or process of knowing in the broadest sense, including both awareness and judgment.“ *Miriam Webster's*
- „Cognition refers to all the processes by which the sensory input is transformed, reduced, elaborated, stored, recovered, and used (including) terms as sensation, perception, imagery, retention, recall, problem solving, and thinking.“ *Ulrich Neisser*
- „Cognition is the collection of mental processes and activities used in perceiving, remembering, thinking, and understanding, as well as the act of using those processes.“ *Mark H. Ashcraft*

# Cognition defined

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- „The most widespread use is as a descriptive term for the large class of so-called higher-level processes, that is, processes not directly driven by the sensory and motor systems.“  
*Understanding Intelligence*

*--> not all-or-none, but continuous*

# Cognitive robotics

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*approaches:*

- „hand design“
- developmental robotics, epigenetic robotics
- evolutionary robotics

--> embodiment perspective

# Cognitive robotics

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*approaches:*

- „hand design“ (here and now)
- developmental robotics, epigenetic robotics (ontogenetic)
- evolutionary robotics (phylogenetic)

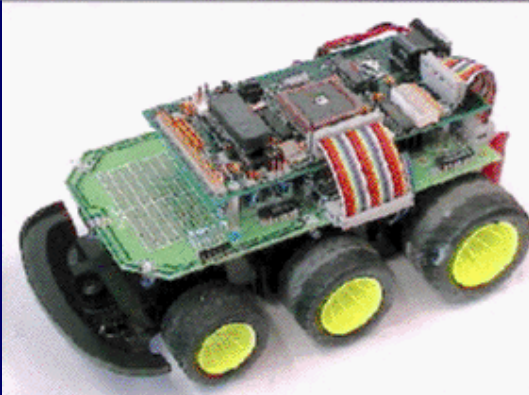
--> embodiment perspective

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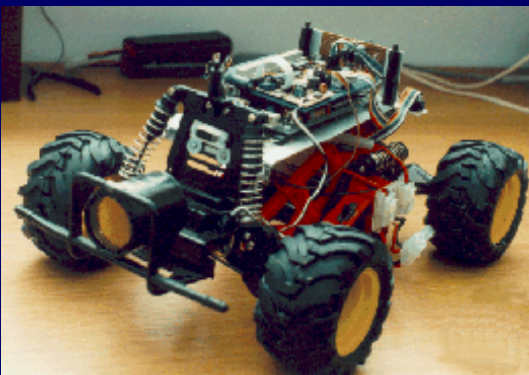
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# Zurich AI Lab robots

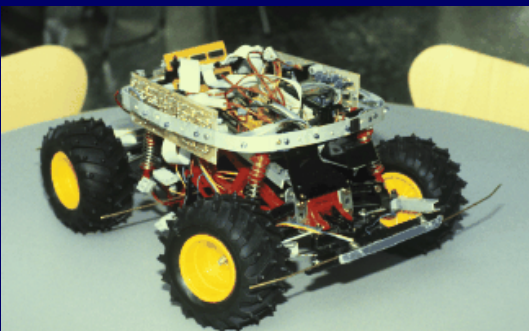


Rufus T.  
Firefly

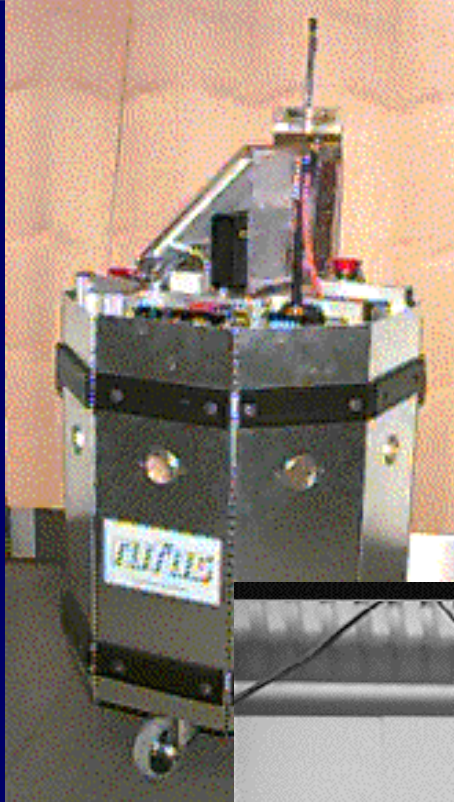
Didabot



Famez

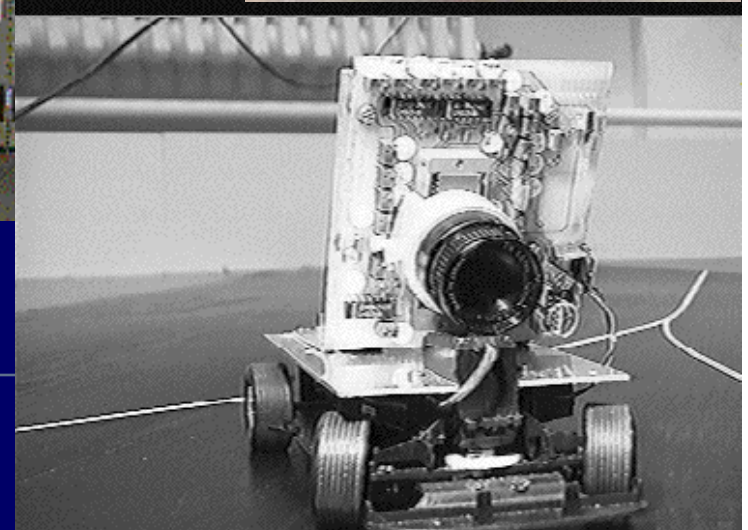


Sita



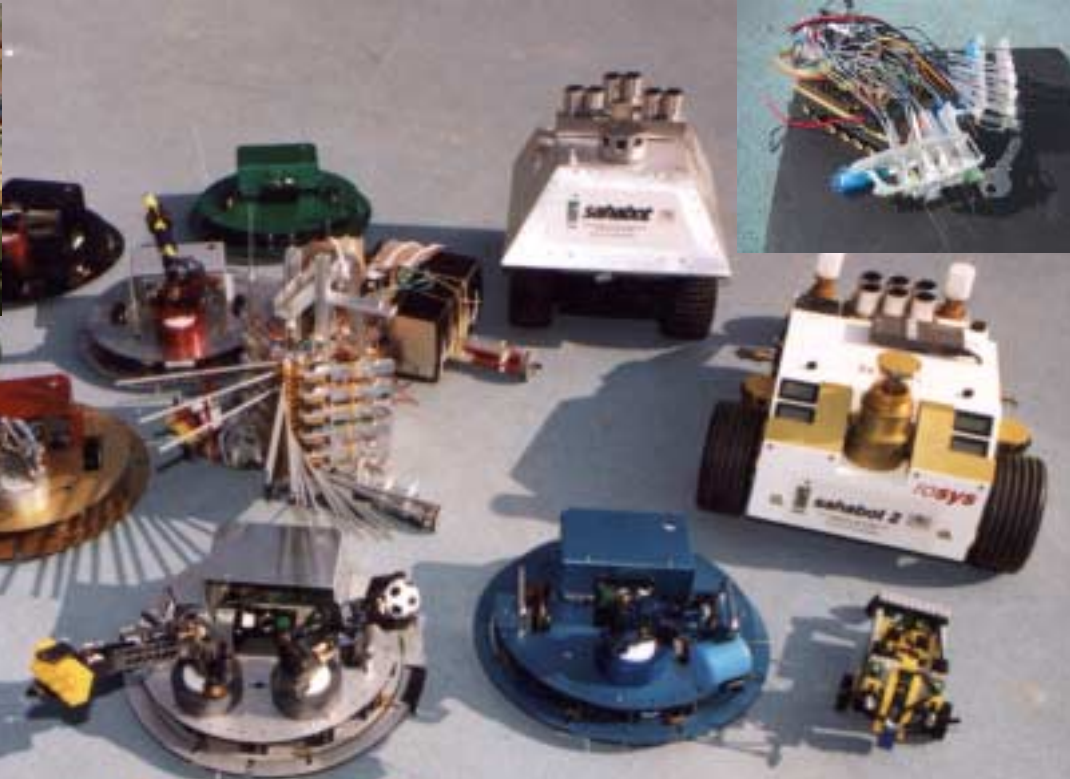
Morpho

Ms. Gloria  
Teasdale





# Zurich AI Lab robots



Amouse  
Sahabots  
Melissa  
Tripp  
Samurai  
Analogrob  
Dexterolator  
Stumpy  
Eyebot  
Mindstorms  
Kheperas  
Mitsubishi  
Forkleg



# Why build robots?

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# Why build robots?

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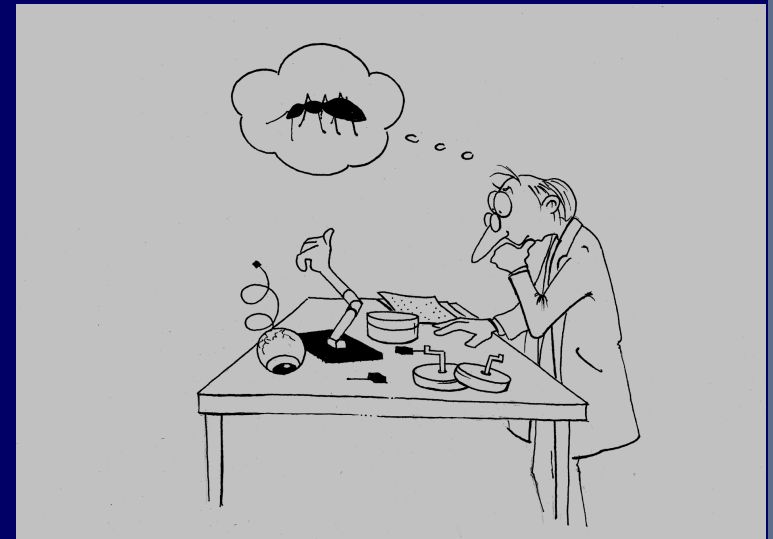
--> synthetic methodology

# Synthetic methodology

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*“Understanding by building”*

- modeling behavior of interest
- abstracting principles



# Synthetic methodology

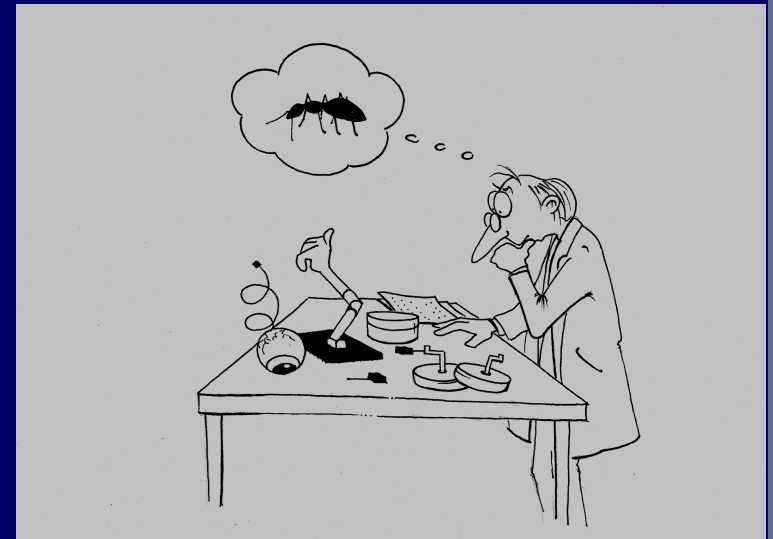
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*“Understanding by building”*

- modeling behavior of interest
- abstracting principles

→ *robots as useful artifacts*

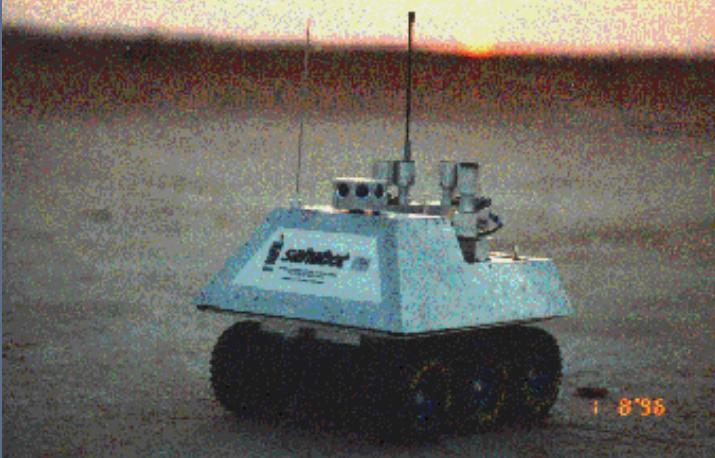
→ *robots as cognitive tools*



# Sahabot I and II



navigation behavior  
of the desert ant  
*Cataglyphis*

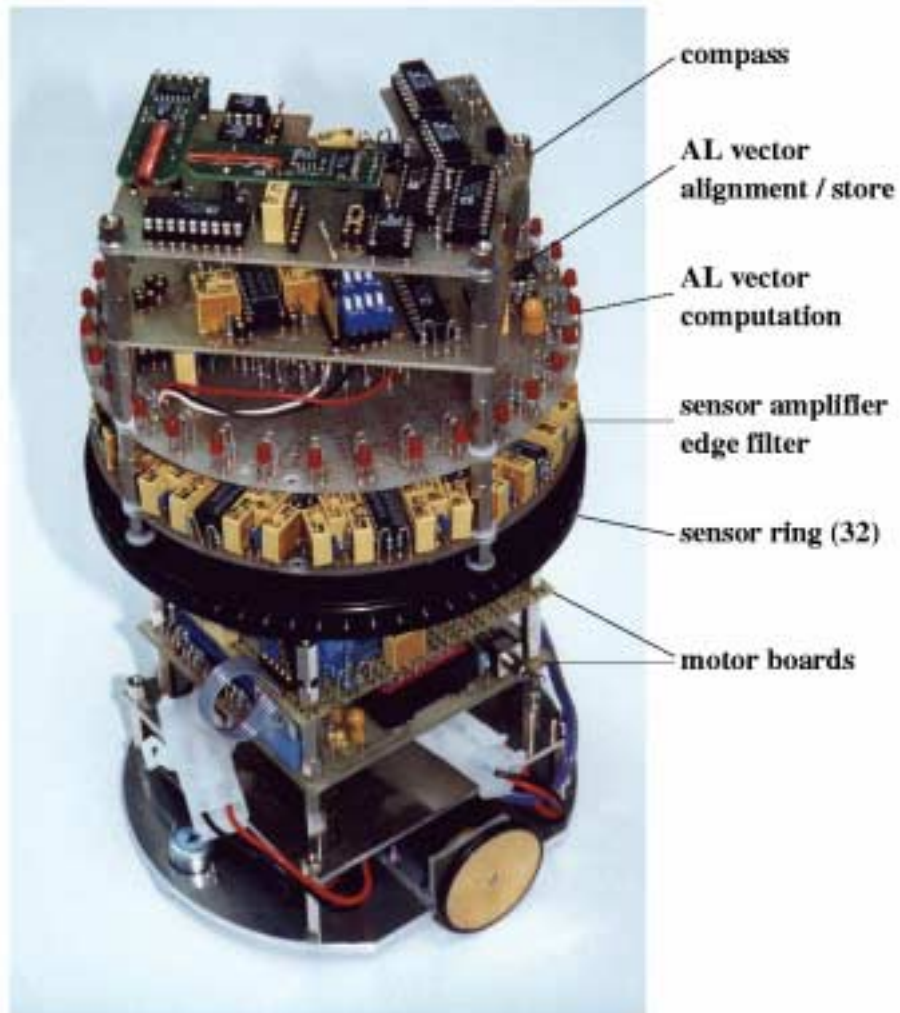


Design and construction:

Hiroshi Kobayashi, Dimitri Lambrinos, Ralf Möller, Marinus Maris

© Rolf Pfeifer

# Analog robot



visual navigation  
behavior of the  
desert ant  
*Cataglyphis*

Design and construction:  
Ralf Möller

# The “Eyebot”

morphology of insect eyes



Design and construction:  
Lukas Lichtensteiger and  
Peter Eggenberger

# The flying robot “Melissa”

navigation behavior of flying insects



gondola with omnidirectional camera

Design and construction:  
Fumiya Iida



# Main train station in Zurich



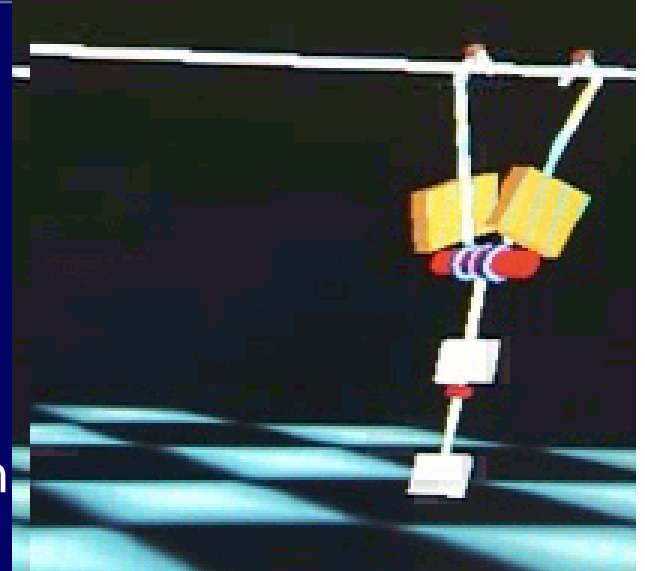
explaining embodiment  
to public at large

# The “Monkey robot”

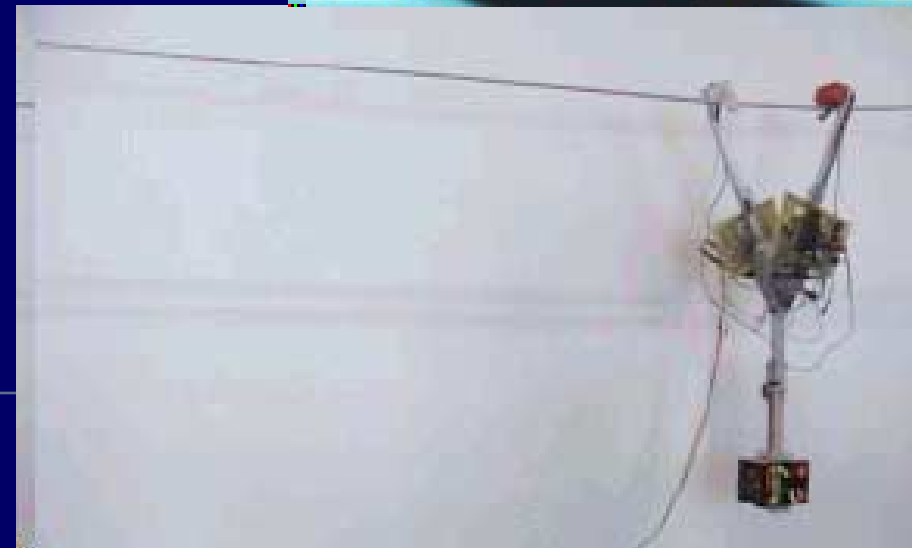
Design and construction:  
Dominique Frutiger



dynamics of brachiation

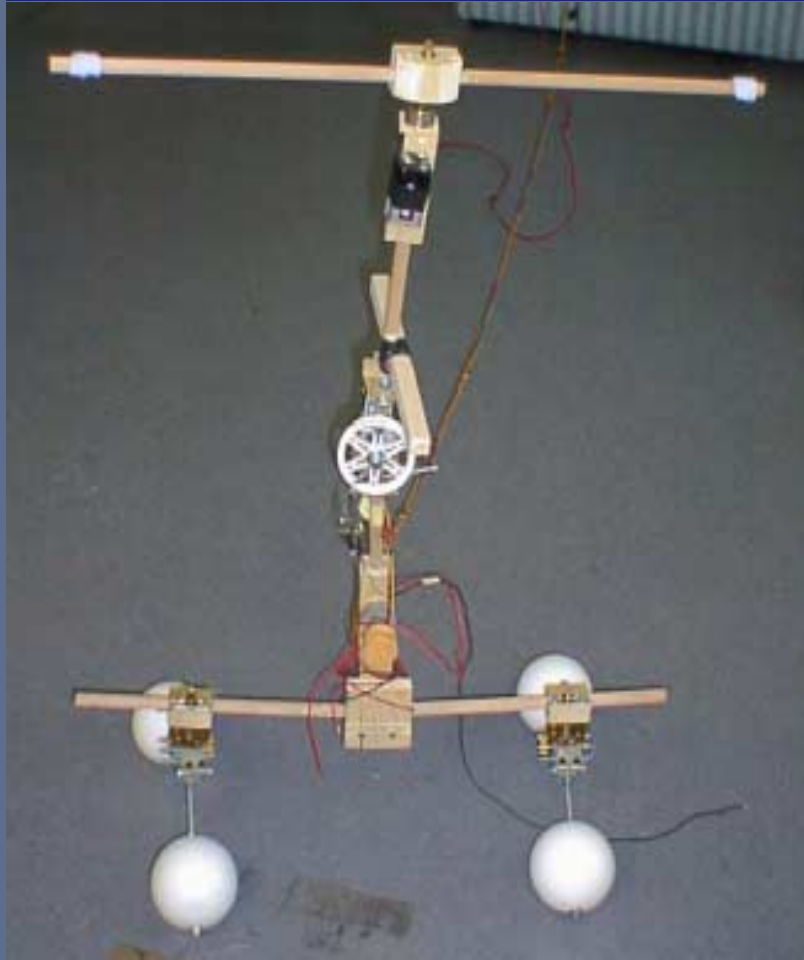


simulation



robot

# The dancing robot “Stumpy”



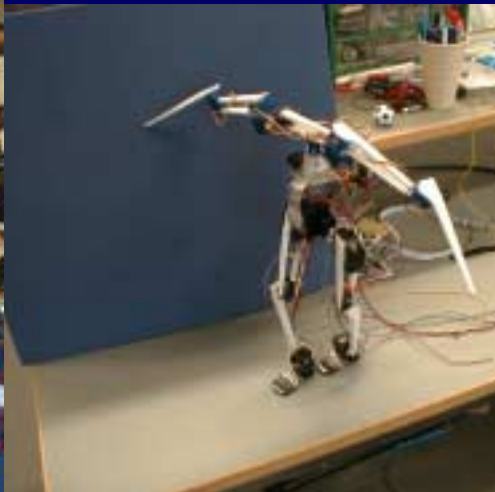
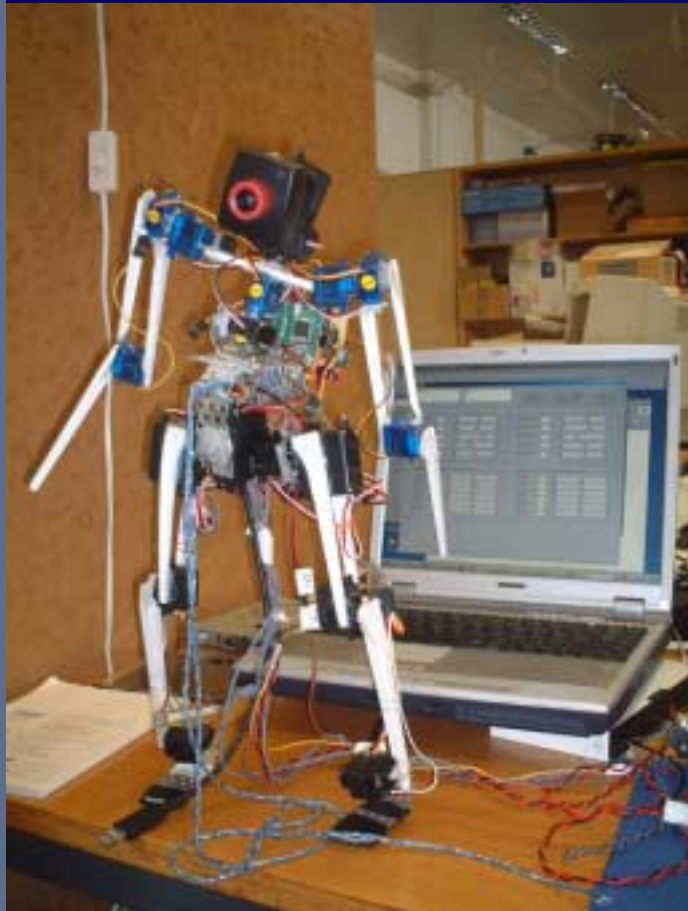
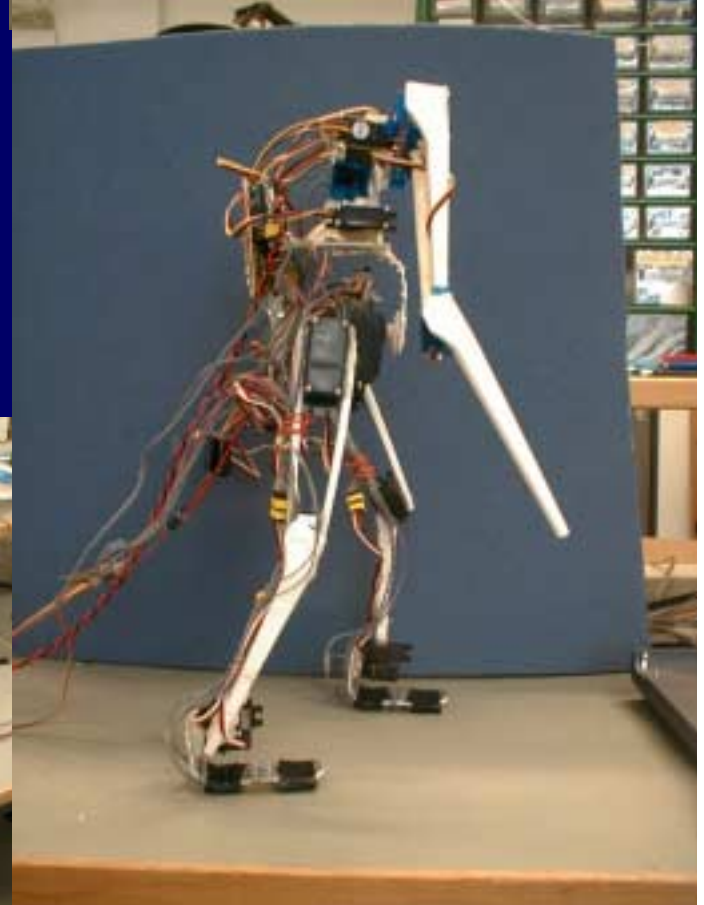
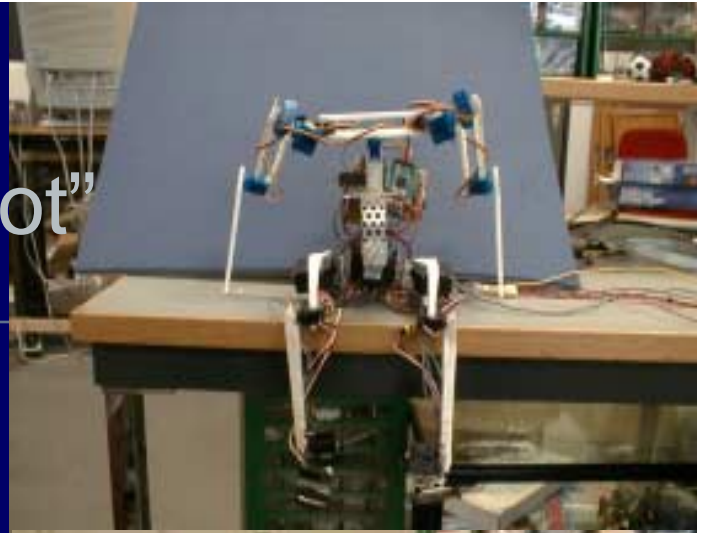
exploring ecological balance

Design and construction:  
Raja Dravid, Fumiya Iida  
Max Lungarella, Chandana Paul

# Der “Forkleg robot”

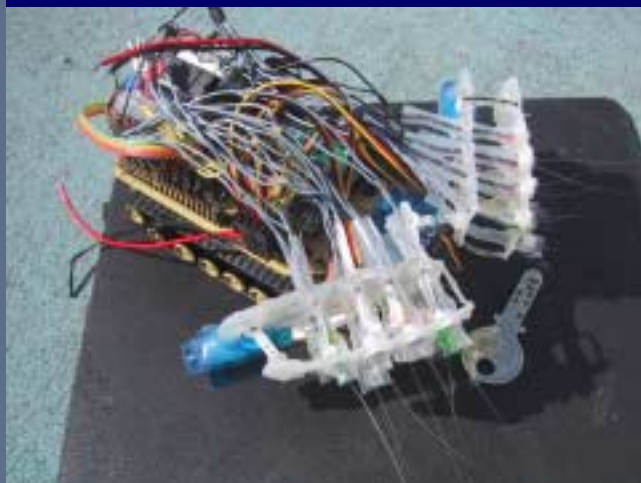
dynamics of biped walking

Design and construction:  
Hiroshi Yokoi  
and  
Kojiro  
Matsushita





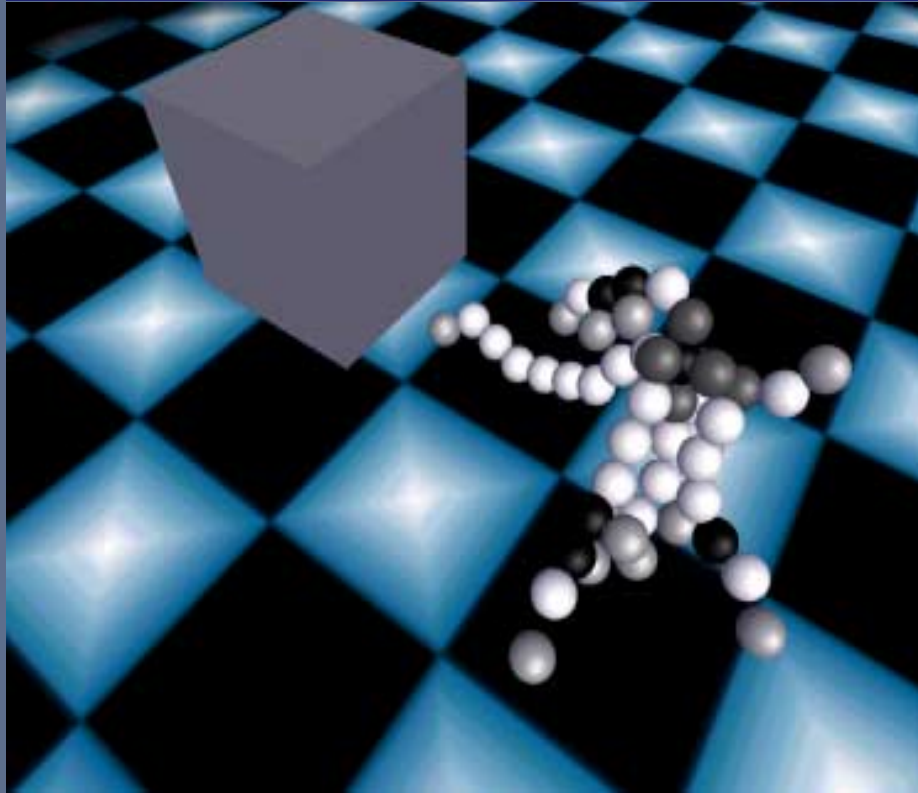
# AMOUSE, the artificial mouse



Design and construction:  
Verena Hafner, Miriam Fend and  
Hiroshi Yokoi

function of whisker systems in rodents

# The “Block Pusher”



task distribution between  
morphology, materials, and  
neural substrate

“life as it could be”



Design and programming:  
Josh Bongard

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# Embodiment

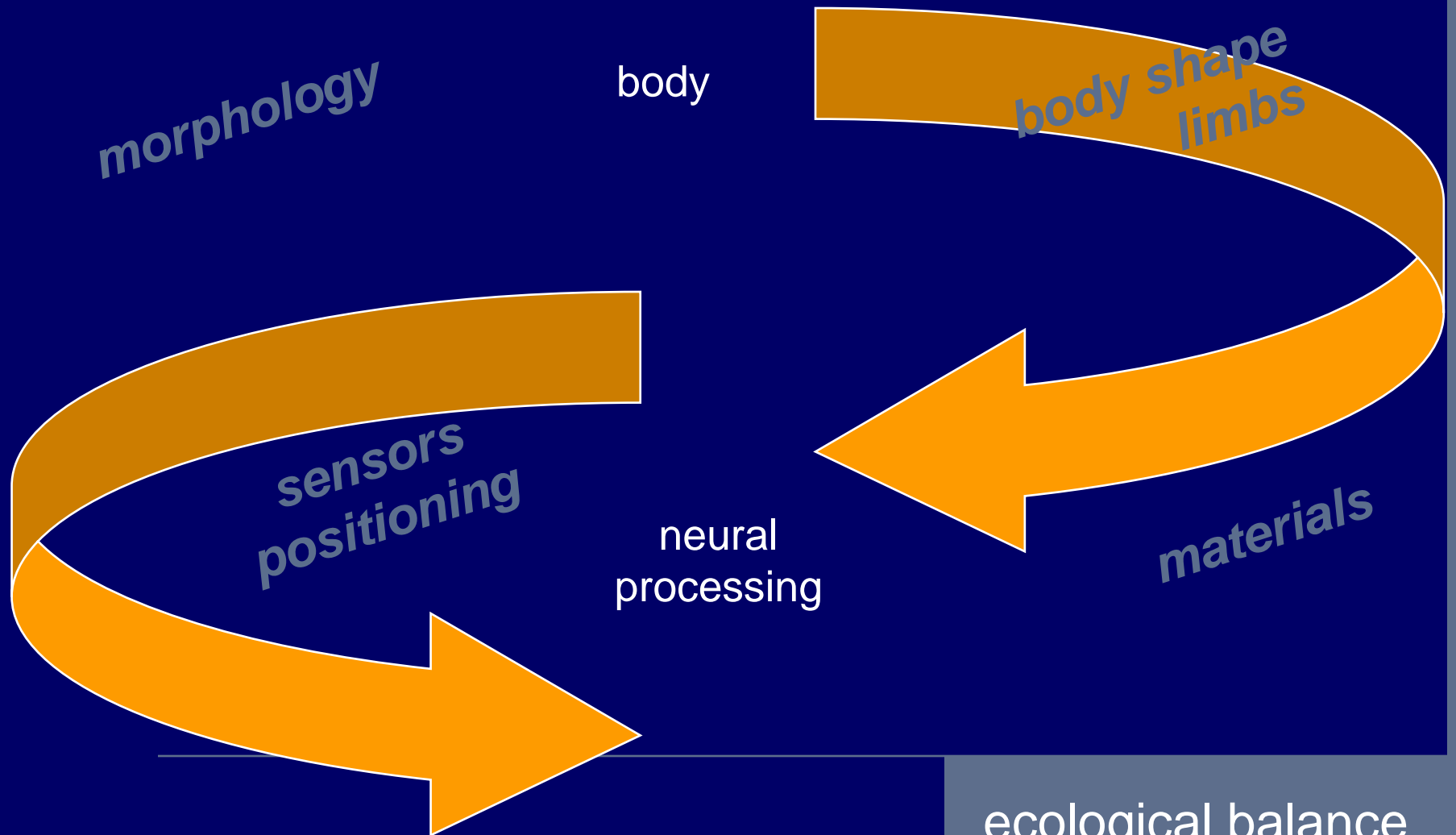
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intelligence must have a body → trivial

non-trivial meaning →



# Embodiment



ecological balance

# Morphology and motor system

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# Goal: natural walking

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# “Passive Dynamic Walker” – the brainless robot

*walking without control*

design and construction  
Steve Collins, Cornell University



morphology:

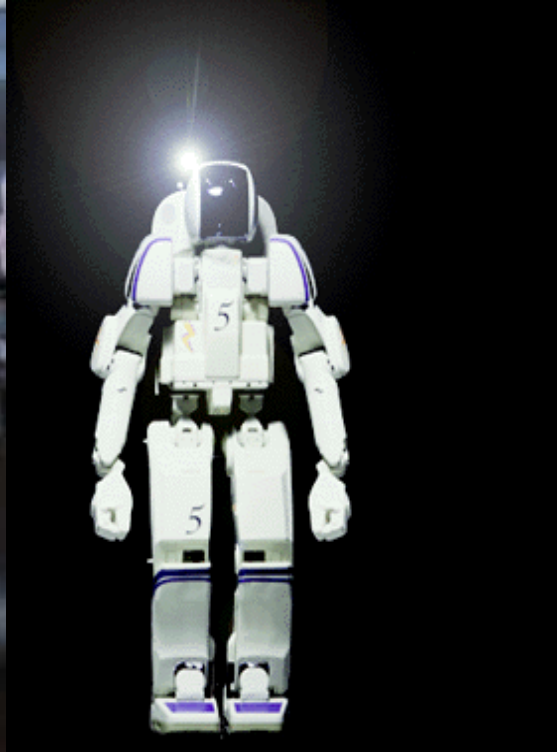
- wide feet
- elastic heels
- counterswing of the arms
- properties of the feet

dynamically stable  
statically unstable

# Asimo (Honda) and H-7 (Univ. of Tokyo)



Asimo



H-7  
design and construction  
S. Kagami, Univ. of Tokyo



# Conclusions from walking study

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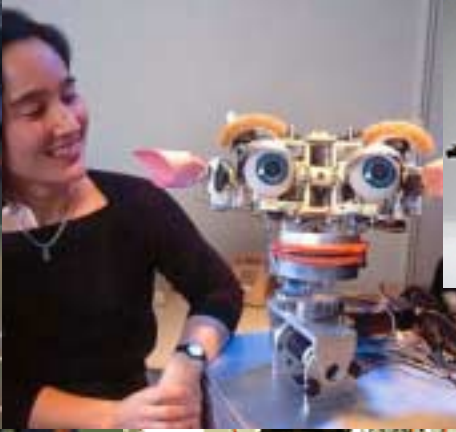
appropriate morphology and materials  
exploitation of dynamics / physics  
→ minimal control effort  
→ energy-efficient walking  
→ natural walking

*and vice versa:*

- hard materials  
no exploitation of dynamics  
→ large effort for control



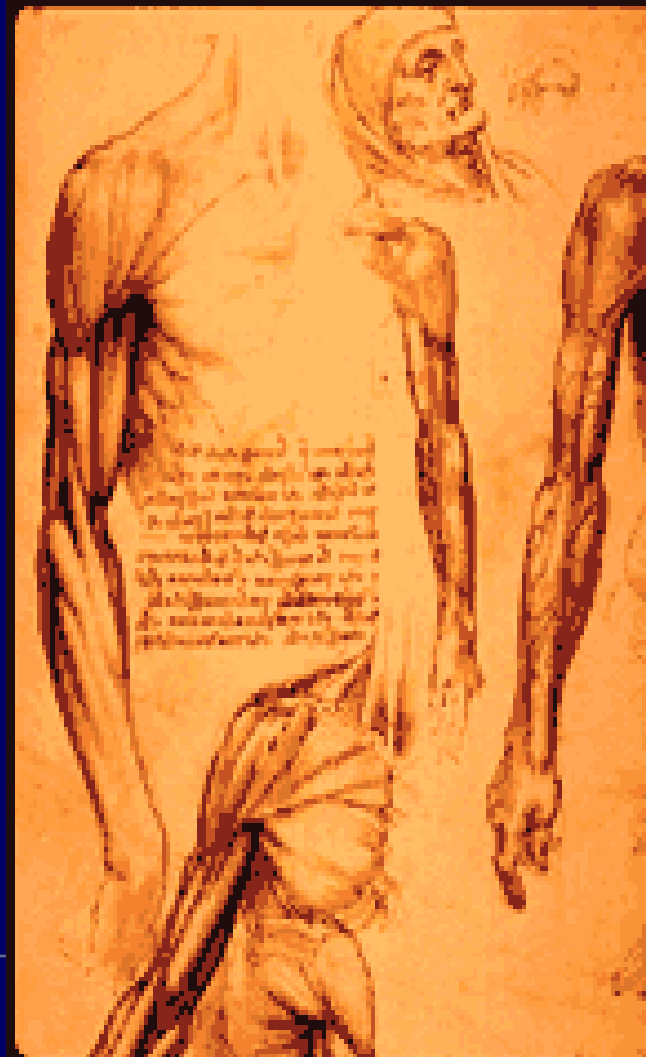
# Humanoid robot epidemic



# Control from materials



traditional robot arms:  
- hard materials  
- electrical motors



human hand-  
arm-shoulder  
system:

- elasticity
- stiffness
- damping



# Properties of the muscle-tendon system

- grasping an object
- winding a spring  
→ energy expenditure
- release  
→ turning back without control
- exploited by the brain



*“good control”*

- decentralized -- little effort of the brain required
- “free” – exploitation of physical properties

# Control from materials

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- spring-like behavior
- stiffness and elasticity
- damping properties

(“computational properties” of materials)

*robots with artificial muscles*

→ exploitation of the dynamics of the (artificial)  
muscle-tendon system

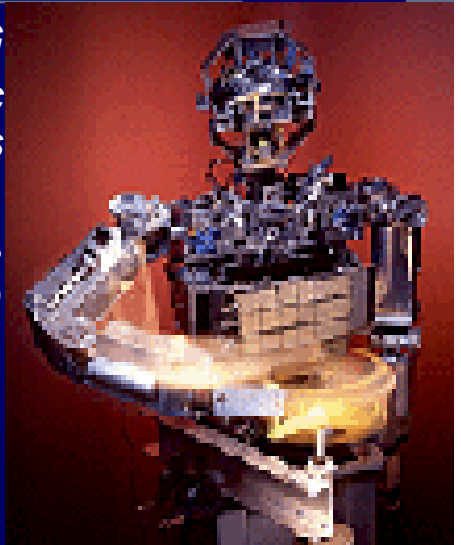
# Robots with artificial muscles



*The service robot  
ISAC*  
**pneumatic  
actuators**  
by Alan Peters  
Vanderbilt University

*COG  
series elastic  
actuators*

by  
Rodney Brooks  
MIT AI Lab



*artificial  
hand*  
**pneumatic  
actuators**

by Lee and  
Shimoyama  
University of  
Tokyo



*Humanoid robot*  
**pneumatic actuators**  
by Rudolf Bannasch, TU Berlin

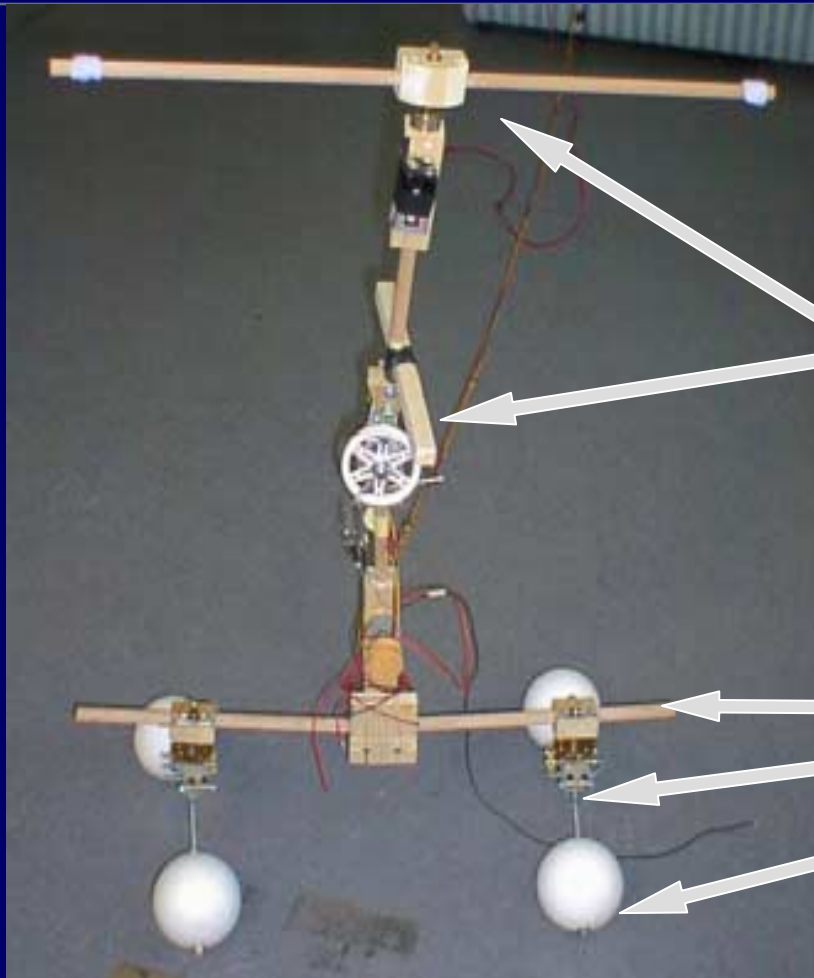


*The Face Robot*  
**shape memory alloys**

by Hiroshi  
Kobayashi  
and Fumio  
Hara



# The dancing robot “Stumpy”



virtually “brainless” (simple control)  
two motors

joints

elastic materials

surface properties

Design and construction:  
Raja Dravid, Fumiya Iida, Max Lungarella, Chandana Paul

# The dancing robot “Stumpy”

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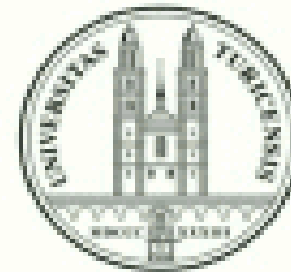
Contact

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<http://www.ifi.unizh.ch/ailab>

# “Stumpy”: Summary

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- Exploitation of dynamics
  - spring-like properties
  - natural elasticity and damping of materials
  - surface properties of the feet
- many behaviors with two joints
- self-stabilization

*good control through morphology and materials*

# Principle of “ecological balance”

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*balance / task distribution between*

- morphology
- materials
- neuronal processing (nervous system)
- environment (scaffolding)

# Interest of locomotion and orientation for cognitive robotics

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- grounding of cognition in sensory-motor patterns
- “body schema”
- spatial abilities essential
- body as basis for metaphors (Lakoff, Johnson)



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perception in the real world
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# Categorization in the real world: fundamental to cognition

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## *categorization:*

- ability to make distinctions in real world
- fundamental to any intelligent system
- closely intertwined with perception

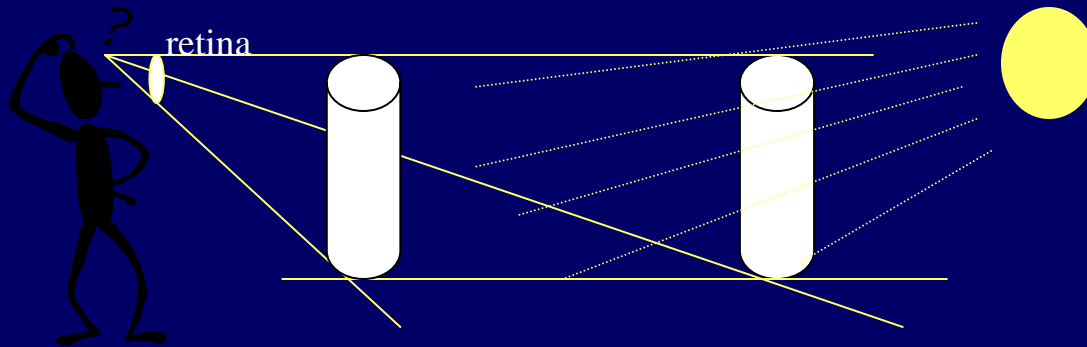
## *careful!*

- frame-of-reference (behavior vs. internal representation)

# Perception in the real world

*Hard problem in real world:*

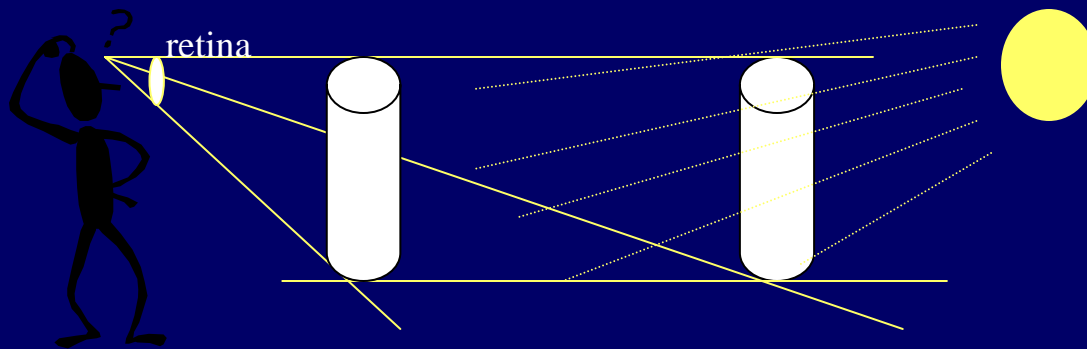
- continuously changing sensory stimulation
- sensory stimulation varies greatly depending on distance, orientation and lighting conditions



# Perception in the real world

*Hard problem in real world:*

- continuously changing sensory stimulation
- sensory stimulation varies greatly depending on distance, orientation and lighting conditions



***Idea 1:***  
**sensory-motor**  
**coordination**

# The principle of sensory-motor coordination

---

***intelligent behavior:*** sensory-motor coordination/  
coupling

***leads to:***

- structuring of sensory stimulation
- generation of correlations in sensory data (“good data”)

***examples:***

- foveation
- reaching, grasping
- perception, categorization

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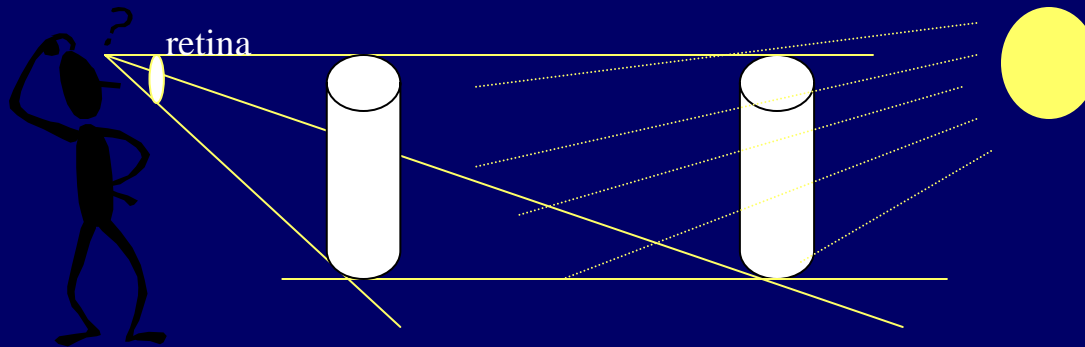
*inspiration*

- John Dewey, 1896 (!)
- Edelman and co-workers
- developmental studies; Thelen and Smith

# Perception in the real world

*Hard problem in real world:*

- continuously changing sensory stimulation
- sensory stimulation varies greatly depending on distance, orientation and lighting conditions



***Idea 1:***  
**sensory-motor  
coordination**

*Sensory-motor coordination:*

- serves to structure sensory input
- provides correlations in different sensory channels

*--> enables learning and concept formation*

# Categorization as sensory-motor coordination

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“We begin not with a sensory stimulus, but with a *sensory-motor coordination* [...] In a certain sense it is the movement which is primary, and the sensation which is secondary, the movement of the body, head, and eye muscles determining the quality of what is experienced. In other words, the real beginning is with the act of seeing; it is looking, and not a sensation of light“.

(John Dewey, 1896)

# Complexity reduction through sensory- motor coordination

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# Complexity reduction through sensory-motor coordination

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it can be shown: sensory-motor coordination leads to

- dimensionality reduction (sensory data)
- induction of correlations in different sensory channels

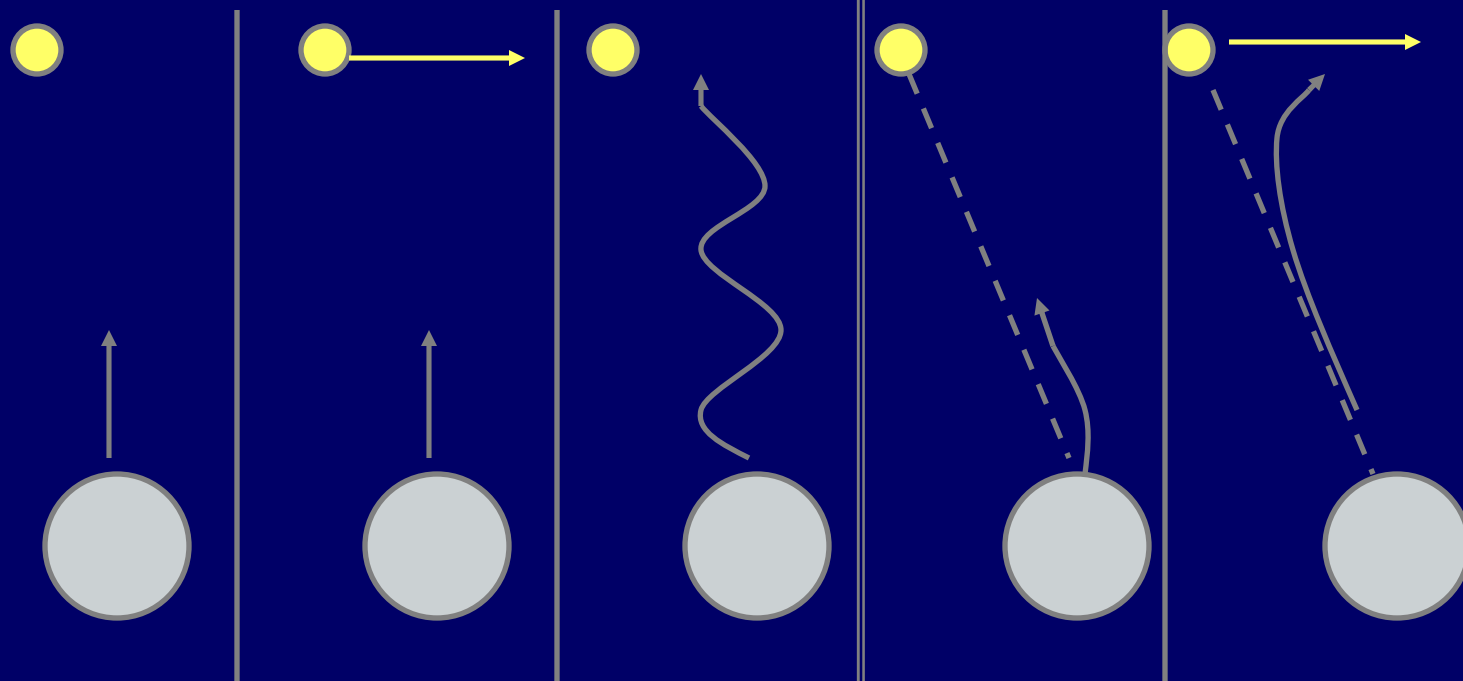
→ *information theoretic reason for sensory-motor coordination*

→ *basis for learning*

*(experiments by Max Lungarella, Gabriel Gomez, and Rene te Boekhorst  
Dimensionality reduction through sensory-motor coordination)*

# Experiments – Idea

comparing not sensory-motor coordinated behavior  
with sensory-motor coordinated behavior



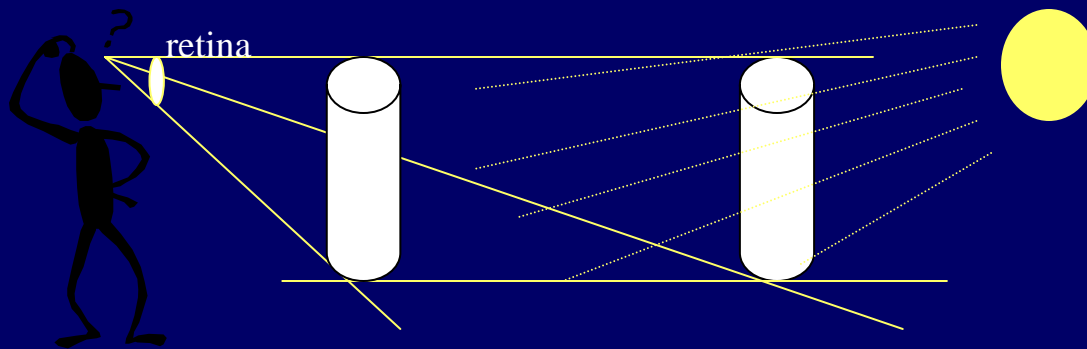
not sensory-motor coordinated

sensory-motor coordinated

# Perception in the real world

*Hard problem in real world:*

- continuously changing sensory stimulation
- sensory stimulation varies greatly depending on distance, orientation and lighting conditions



***Idea 1:***  
**sensory-motor  
coordination**

***Idea 2:***  
**development**

# „Developmental robotics“

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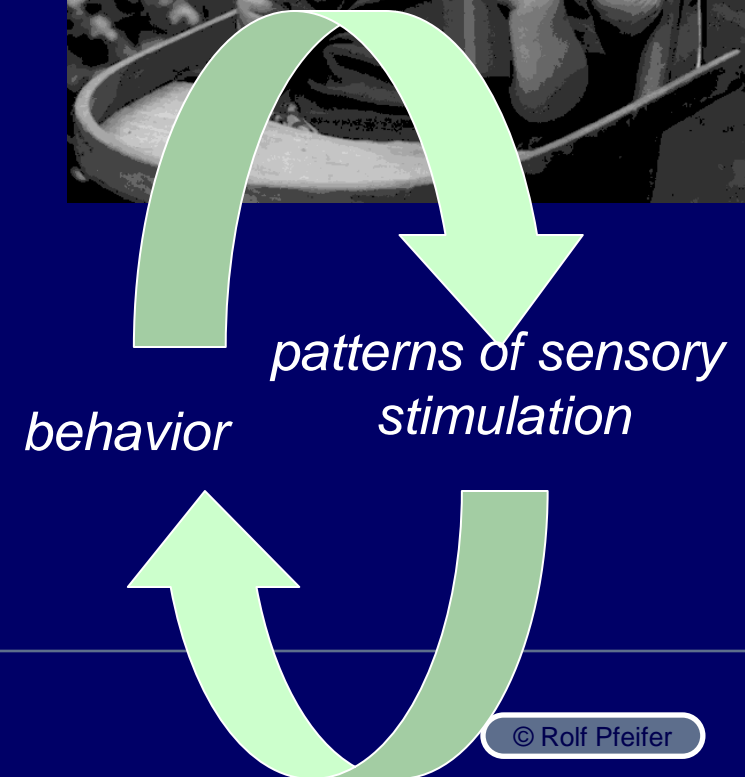
- robot interacting with the environment over extended periods of time → individual history
- advantage of robots: record internal and sensory-motor states → analyze time series
- goals:
  - learning categorization/perception
  - „body schema“ / „body self-image“
  - „sense of presence“

→ *robots as cognitive tools*

# Facilitation through morphology and materials

- constraining movements
    - generating rich sensory stimulation
    - inducing correlations
- enables cross-modal associations

example:  
random neural stimulation



# Bootstrapping „high-level cognition“

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- sensory-motor coordination
  - cross-modal associations
    - basic categorization behavior
      - gradual decoupling from sensory-motor level
        - same neural structures involved (mirror neurons)
          - new types of mechanisms?

# Technological requirements

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- complex sensory and motor systems
- bendable high-density touch sensors
- artificial muscles
- soft materials

## *Currently in place/in progress:*

- binocular active vision system (Gabriel Gomez, Hiroshi Yokoi)
- robot arm (Mitsubishi)
- experiments with pneumatic actuators (Raja Dravid)
- experiments with spring-like muscle-tendon systems (Hiroshi Yokoi)

# „Developmental robotics“: Research directions

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- sensory-motor coordination (foveation, visual tracking, grasping) (Brooks, Sandini, Metta, Schaal, Pfeifer)
- social interaction and communication (Breazeal, Kuniyoshi, Steels)
- learning by imitation (Kuniyoshi, Schaal, Dautenhahn, Berthouze, Gaussier, Sandini, Metta)
- reinforcement learning (Asada)

also: robots learning by imitating humans (Schaal, Metta)



# „Developmental robotics“: Activities

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- EDEC-workshop: Emergence and Development of Embodied Cognition
- DECO-workshop: Development of Embodied Cognition
- Epigenetic robotics workshop
- Cognitive robotics workshop (AAAI) (careful!)

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# Artificial evolution and morphogenesis

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not only “life as it is”  
but “life as it could be” (Chris Langton)

Implication of embodiment:

*Co-evolution of morphology and neural control*

*exploring “ecological balanced”*

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# The “Zen of robot programming”

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- relax, the real world is there
- it's your friend, not your enemy — exploit
- not everything needs to be controlled — physics is for free

***Rodney Brooks, MIT Artificial Intelligence Laboratory***

# Summary

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- cognitive robotics — robots as cognitive tools
- embodiment — implications: ecological balance
- categorization and perception: sensory-motor coordination and developmental robotics

# Related projects

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- Explorations in embodied cognition (Swiss National Science Foundation)  
Goals: similar to ADAPT
- AMOUSE – Artificial Mouse (EU)  
Goals: multi-modal exploitation (whisker system, visual system)

# Papers

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- te Boekhorst, R., Lungarella, M., and Pfeifer, R. (submitted). Dimensionality reduction through sensory-motor coordination.
- Lungarella, M., and Berthouze, L. (2002). Adaptivity through physical immaturity.
- Lungarella, M., and Berthouze, L. (2002). Adaptivity via alternate freeing and freezing of degrees of freedom.
- Lungarella, M., and Pfeifer, R. (2002). Robots as cognitive tools: information theoretic analysis of sensory-motor data. *Humanoid Robotics Conference*.
- Eggenberger, P., Gomez, G., and Pfeifer, R. (2002). Evolving the morphology of a neural network for controlling a foveating retina - and its test on a real robot.
- Pfeifer, R. (several). On the role of morphology and materials in the emergence of cognition.

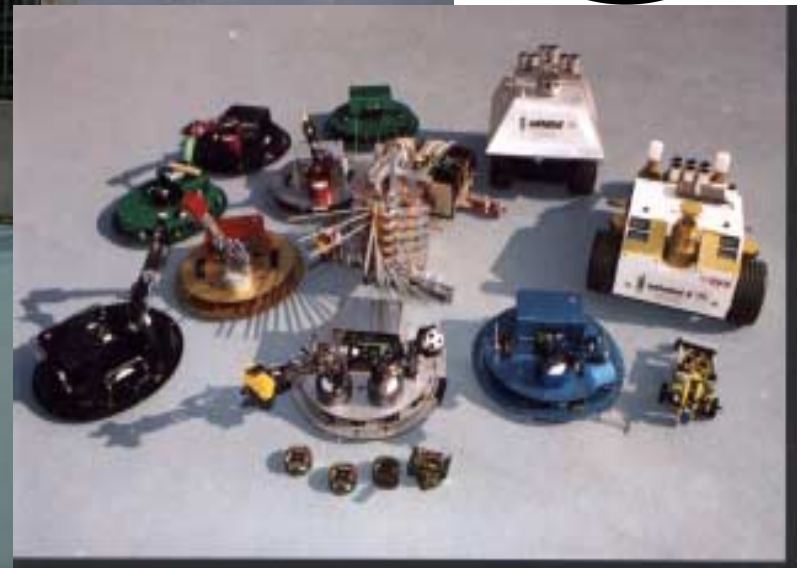
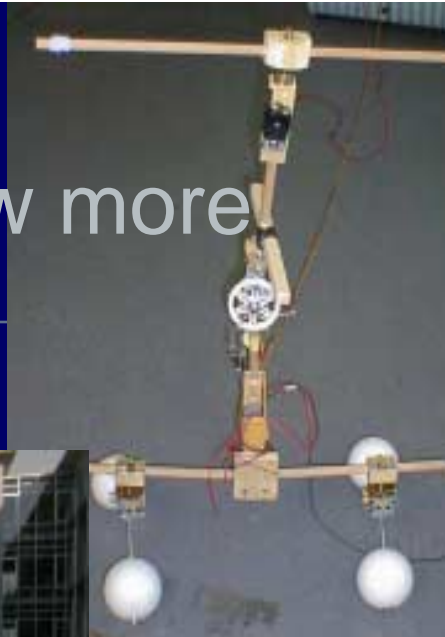


# Recruiting: PhD students for ADAPT project

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Want to know more

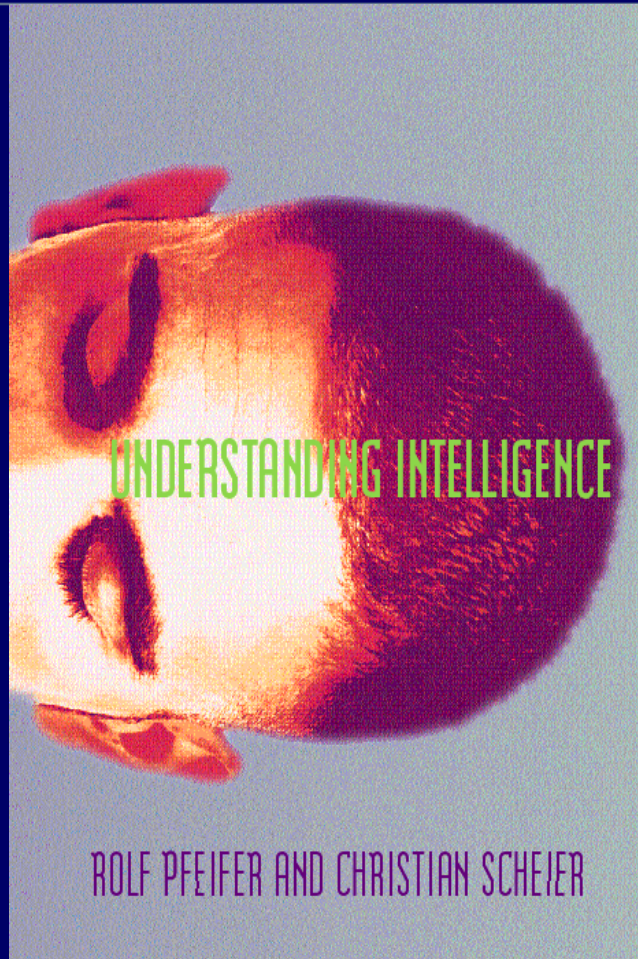
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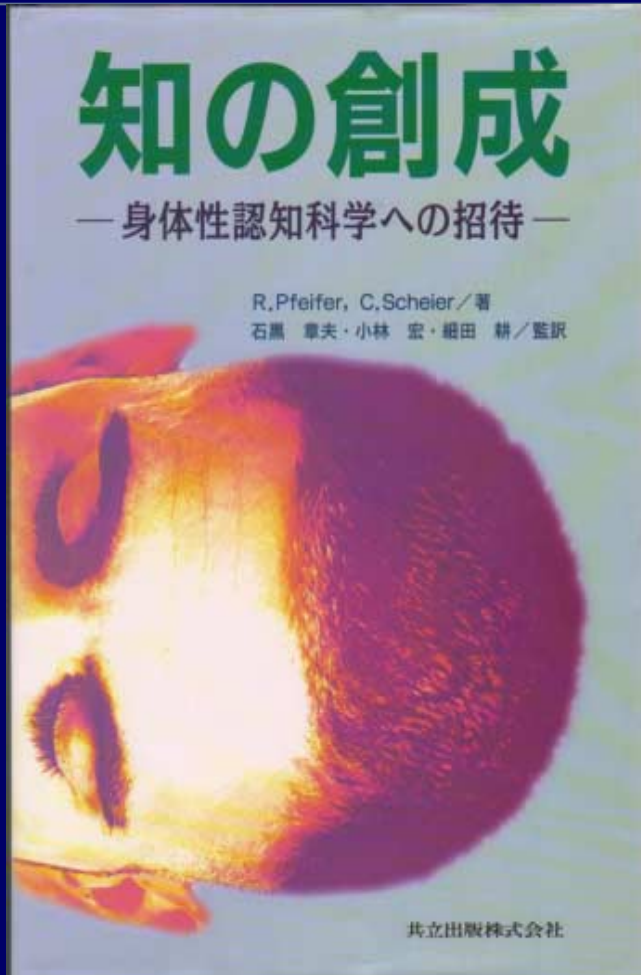
or read:



MIT Press  
November 1999  
(2<sup>nd</sup> printing 2000, paperback edition)

*“Understanding Intelligence is a comprehensive and highly readable introduction to embodied cognitive science.”*  
– **Arthur B. Markman**, *Science*

or in Japanese



translated by: Koh Hosoda, Akio Ishiguro  
and Hiroshi Kobayashi  
with a preface by: Minoru Asada



# Comparison



# Felix, Regula and Exuperantius

the three saints of the city of Zurich



Grossmünster



*Legend??*

→ *“passive dynamic walkers”*