

Neural Networks

25 May 2012

Morphological computation



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ai lab



FET Flagships: a new and ambitious European initiative
Rise of Sentient Machines? Robot Companions for Citizens

Enabling technology for sustainable welfare



Morphological Computation and Design Concepts for Future High Efficiency Robots

Bern, 22 May 2012



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Swiss National
Competence Center, Robotics



Buzzwords

amorphous computing

self-assembling robots/materials

morphological computation

biochemical circuits

passive dynamics

molecular recognition systems

cellular computing

biomolecular devices

membrane computing

self-stabilization

autopoiesis

tensegrity

trading space

blob computing

DNA/molecular computing

patterning

genetic regulatory networks

self-organization

self-repair

neuromorphic computing/engineering

...

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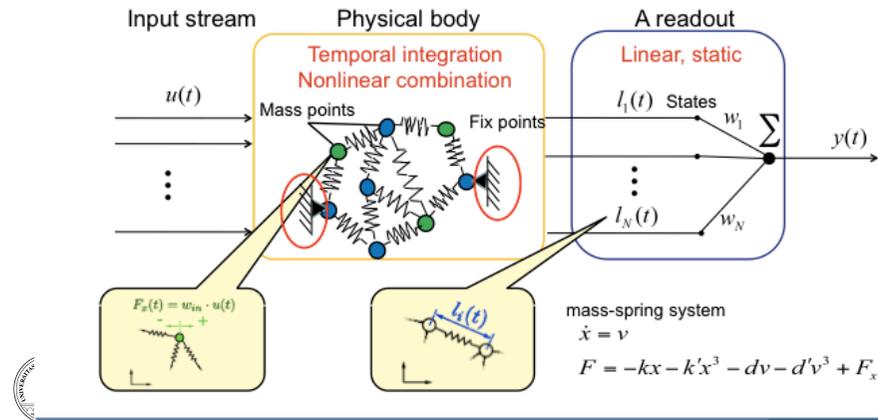
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Reservoir computing



T3.1.1 Theoretical Foundation for Morphological Computation (TUG+UniZu) – proposed model 1

Basic idea: a physical body as a reservoir



Goals

- **power of concept “morphological computation”**
- **research technological challenges**
- **create “mind set” for design**

Contents

- **background and introduction**
- **morphological computation: examples and case studies**
- **the “power of materials”**
- **exploiting sensory morphology**
- **information structure through sensory-motor coordination**
- **research challenges**
- **the Swiss perspective**

Embodiment, “soft robotics”, and morphological computation

Hypothesis: The next generation of robots - the Robot Companions - will be of the “soft” kind. Advances in “soft technology” will lead to a quantum leap in intelligent robotics.

Theoretical underpinnings: The key to “soft robotics” will be an understanding of embodiment, which in turn, requires an understanding of morphological computation.

“Soft”:

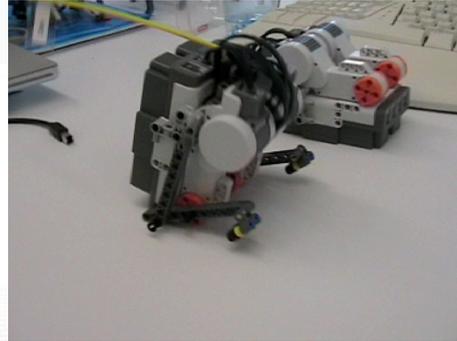
- varying degrees of softness**
- changeable material characteristics**
- multifunctionality**

Getting into the “spirit” of embodiment

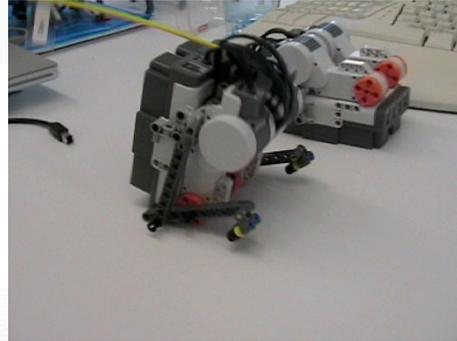


“Crazy Bird” - morphology and control

loosely hanging feet
rubber/plastic



“Crazy Bird” - morphology and control



loosely hanging feet
rubber/plastic

behavior of “Crazy
Bird”: emergent

Principle 1: Physical embedding

Studying brain (or control) not sufficient:

Understanding of

- **embedding of brain into organism**
- **organism's morphological and material properties**
- **environment**

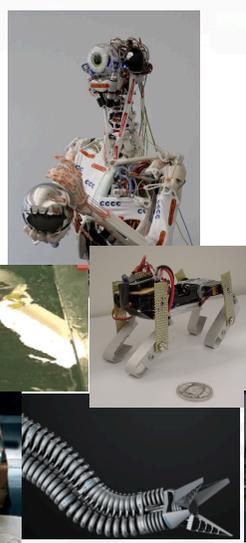
required

“Soft robotics”

Soft to touch



Soft movement



Soft interaction



Expression



happy

angry

Morphological computation: “Definition”

Morphological computation designates the idea that part of the computation required for particular behaviors can be performed by the body, incorporated into the morphological and material characteristics of the agent. The brain itself, as part of the body, also applies morphological design principles to achieve its computational tasks.

Morphological computation: requirements (Norman Packard)

- **need I/O**
- **need programmability**
- **need teleological embedding
(functionality, purpose, goal)**

(from “International Conference on
Morphological Computation” 2007
summary of discussion)

Variants of morphological computation

- **embodied computation, digital result** - need for read-out process (e.g. DNA computing, molecular computing, reservoir computing)
- **fully embodied** (e.g. self-assembling vesicles / molecules, passive dynamic walker, “Cornell Ranger”, “Wanda”, Octopus, “Coffee Ballon Gripper”)

Fully embodied: here the desired functionality is the behavior of the system itself, irrespective of whether we consider the body as computing or not. However, the “computation” of the body can be exploited (e.g. to produce certain information about the environment, for example, the steepness of the terrain in “Puppy”).

There has to be a readout process that can be viewed as the translation of the physical state of the system back to its digital interpretation in terms of the original – digital – problem. The standard computational problems – unusual (physical) computational process.

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Examples and case studies of morphological computation

- the “Passive Dynamic Walker”
- the “Cornell Ranger”
- the compliant humanoid “Coman”
- the dancing robot “Stumpy”
- the robot fish “Wanda”
- the artificial “Octopus”
- the “coffee-balloon gripper”
- the “Tribolons”

Walking: Classical control



Sony Qrio:
high stiffness
centralized control
computationally intensive



“Passive Dynamic Walker”



Design and construction:
Ruina, Wisse, Collins: Cornell University
Ithaca, New York



The “brainless” robot:
walking without control

“Passive Dynamic Walker”



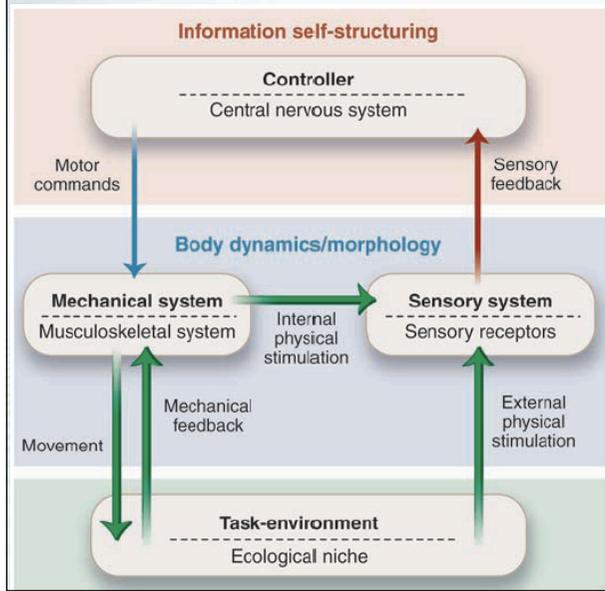
Design and construction:
Ruina, Wisse, Collins: Cornell
Ithaca, New York

morphological computation:
**exploitation of passive
dynamics and mechanical
feedback**

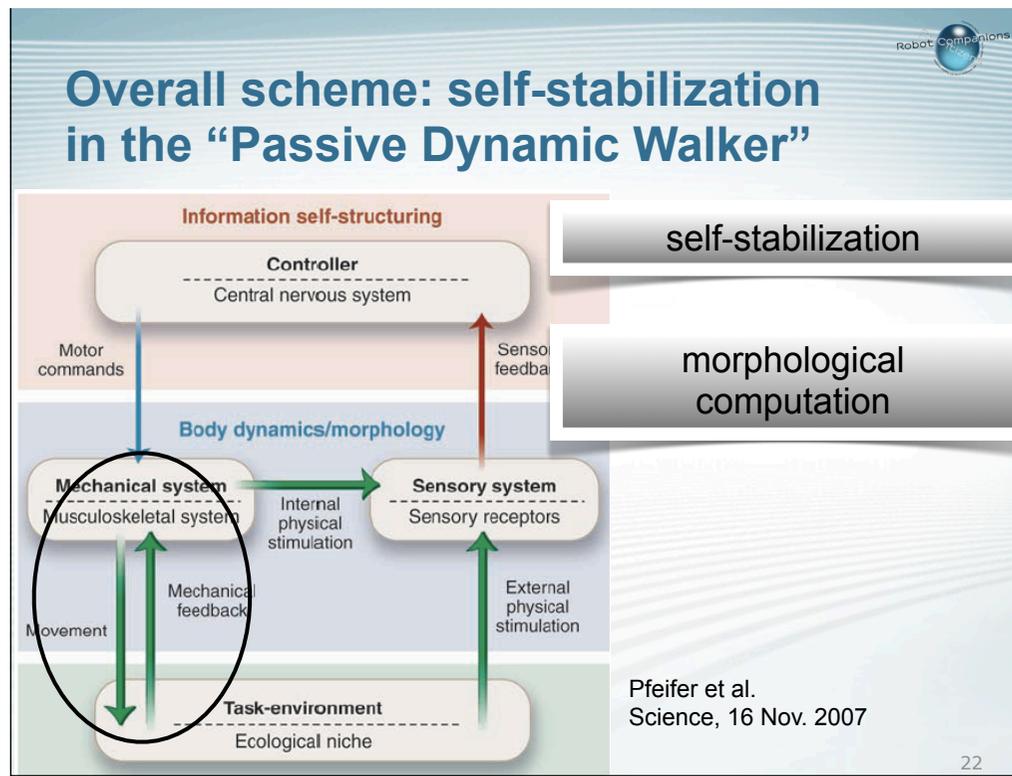


The “brainless” robot”:
walking without control

Overall scheme



Pfeifer et al.,
Science, 16 Nov. 2007



Exploitation of passive dynamics: is an instance of self-organization.

These principles apply also to human walking — dynamic change of muscle tension depending on phase within walking cycle.

Short question

memory for walking?



The “Cornell Ranger”



Design and construction:
Andy Ruina
Cornell University



Ranger walks by, clunk-clunk-clunk

**65 km on one battery
charge!**

The almost “brainless” robot:
**morphological computation
and energy efficiency**

Fully embodied: here the desired functionality is the behavior of the system itself, irrespective of whether we consider the body as computing or not. However, the “computation” of the body can be exploited (e.g. to produce certain information about the environment, for example, the steepness of the terrain in “Puppy”).

There has to be a readout process that can be viewed as the translation of the physical state of the system back to its digital interpretation in terms of the original – digital – problem. The standard computational problems – unusual (physical) computational process.

The "Cornell Ranger"



Design and co-creator
Andy Ruina
Cornell University

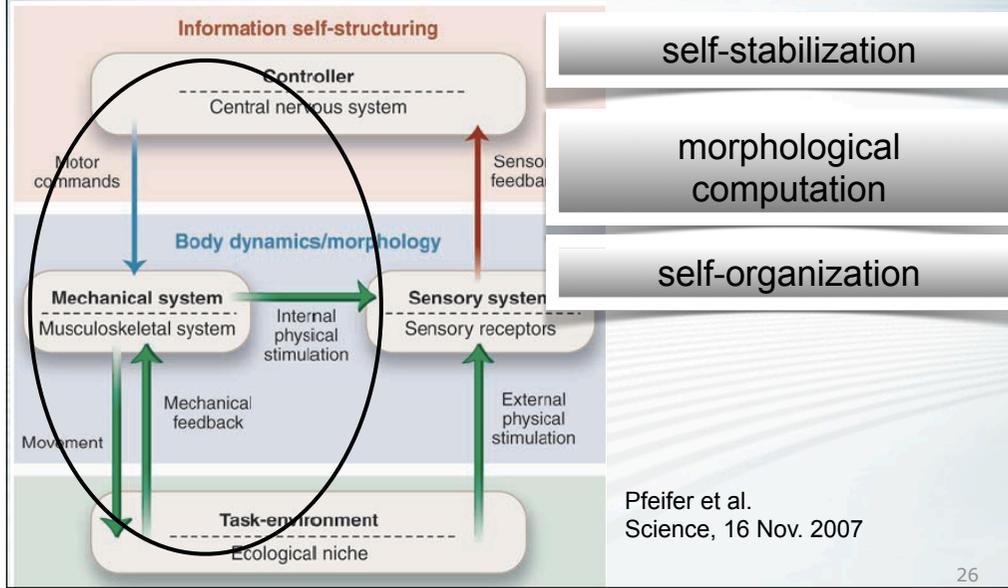
morphological computation:
**exploitation of passive dynamics
and morphology**

**65 km on one battery
charge!**

The almost "brainless" robot":
**morphological computation
and energy efficiency**

Previously, nobody would have thought this to be possible.

Overall scheme: self-stabilization in the "Cornell Ranger"

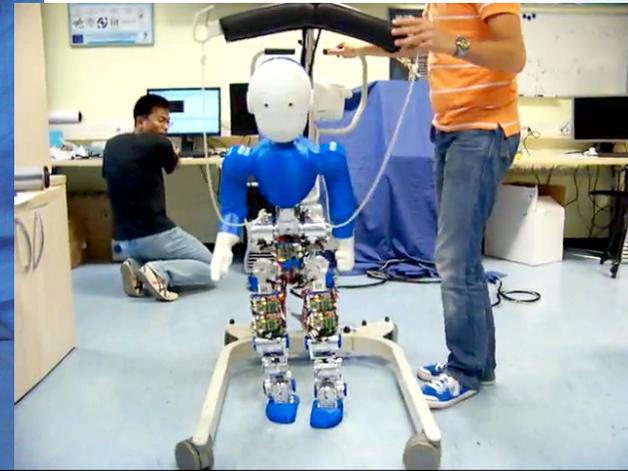
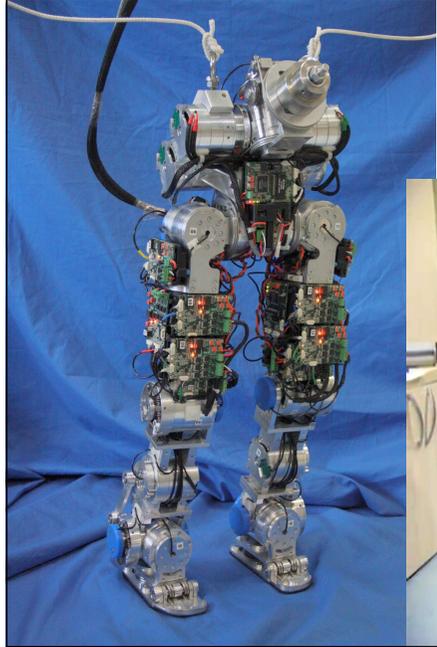


Human walking

- dynamical change of stiffness of muscles
- exploitation of passive swing forward
- high stiffness on impact
- coping with unevenness of ground
- “outsourcing” of functionality

IIT's "Coman" - Compliant Humanoid Robot

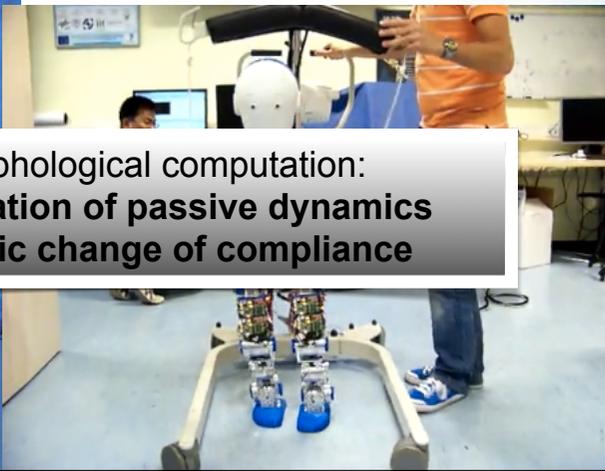
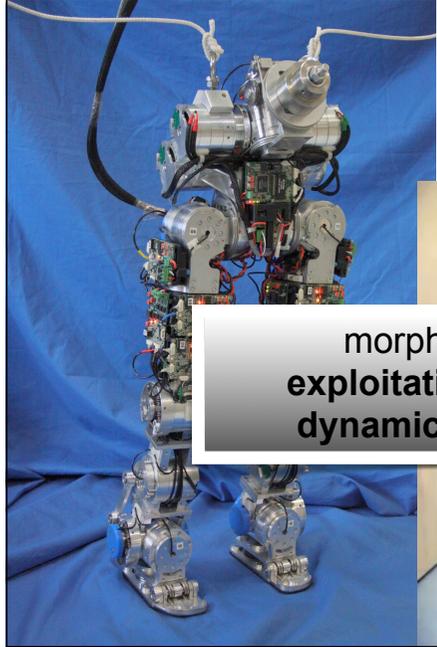
Design and construction:
Nikos Tsagarakis, IIT, Genova



variable-compliance: can dynamically change stiffness of joints; springs at joints —> coping with unevenness in the ground.

IIT's "Coman" - Compliant Humanoid Robot

Design and construction:
Nikos Tsagarakis, IIT, Genova



morphological computation:
exploitation of passive dynamics
dynamic change of compliance

operates with on less than 200W
application to human walking

Principle 2: Task distribution

Task distribution between brain (control), body (morphology, materials), and environment

no clear separation between control and hardware (“soft robotics” - compliant legs)

Principle 2: Task distribution

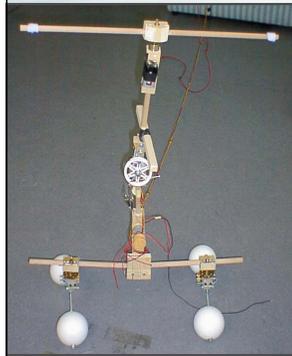
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re-thinking of “control”
 (“orchestration”)
 in terms of morphological computation

- **exploitation of passive dynamics**
- **exploitation of - changeable - material properties**

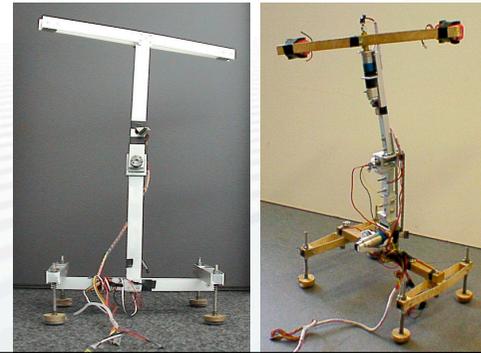
The dancing robot “Stumpy”



almost brainless: 2 actuated joints
springy materials
surface properties of feet

Design and construction: **Raja David,**
Chandana Paul, Fumiya Iida

—> many different gait patterns with only 2 joints



Choreography with “Stumpy”



Movie:
Dynamic Devices
and AILab, Zurich

(with Louis-Philippe Demers, Nanyang Technological University, Singapore)

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The “robot frog” driven by pneumatic actuators (UTokyo)



Design and construction:
**Ryuma Niiyama and
Yasuo Kuniyoshi**
University of Tokyo

pneumatic actuators:
compliant materials



THE UNIVERSITY OF TOKYO
Ryuma Niiyama, Yasuo Kuniyoshi,
“Mowgli: A Bipedal Jumping and Landing Robot”, ICRA 2007.

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The damped oscillatory movement after impact is not controlled but the result of the morphological and material characteristics (pneumatic actuators).

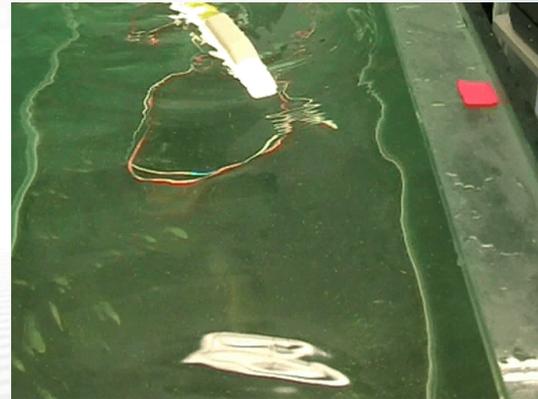
The power of materials: The robot fish “Wanda”

design and construction:
Marc Ziegler, AI Lab, UZH

materials

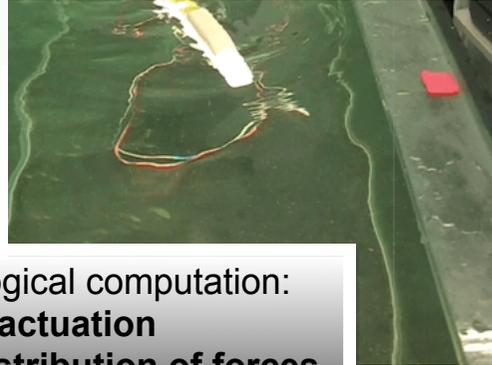
changeable stiffness

**maneuverability in
3D space**



The power of materials: The robot fish “Wanda”

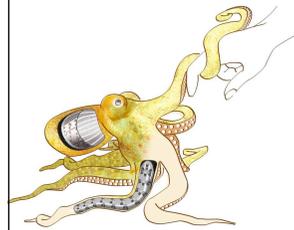
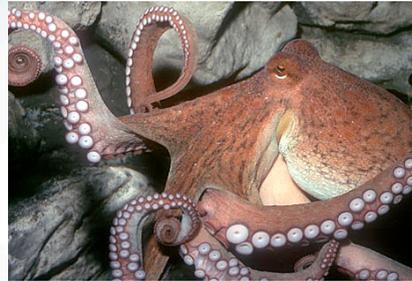
design and construction:
Marc Ziegler, AI Lab, UZH



materials
changeable st
maneuverabili
3D space

morphological computation:
actuation
optimal distribution of forces
along tail fin

The power of materials: The robot octopus (Cecilia Laschi)



Octopus arm
design and construction:

Matteo Cianchetti (SSSA)
Cecilia Laschi (SSSA)
Tao Li (UZH)
Naveen Kuppuswami (UZH)

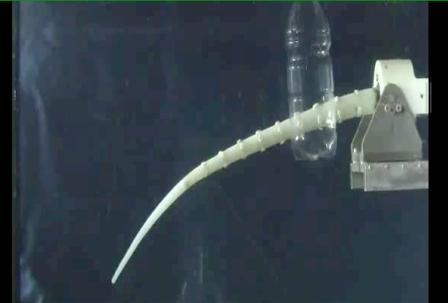
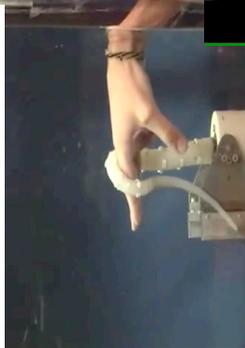


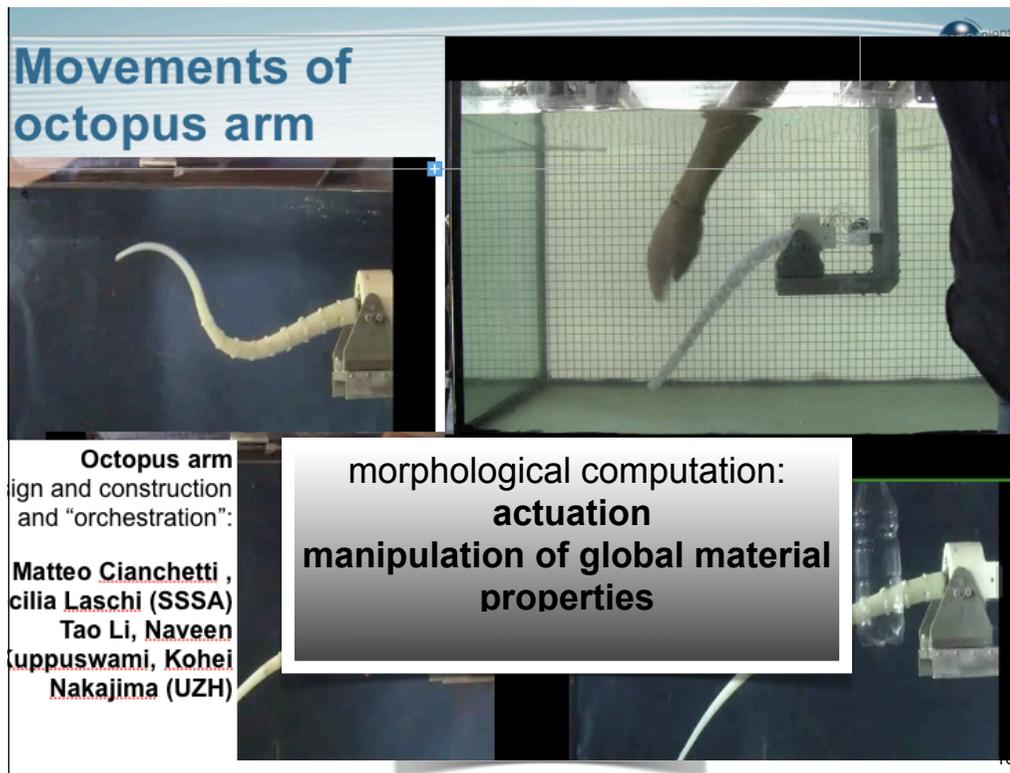
Movements of octopus arm



Octopus arm
design and construction
and "orchestration":

**Matteo Cianchetti ,
Cecilia Laschi (SSSA)
Tao Li, Naveen
Kuppuswami, Kohei
Nakajima (UZH)**





mouvements d'un prototype

actionnement de la base du bras - le reste est passif

plusieurs conceptions: cables attachés à positions divers à l'intérieur du bras;

propagation d'une onde de rigidité (plutôt que controller des segments individuels)

Orchestration of grasping



stably grasping hard object
other manipulation tasks

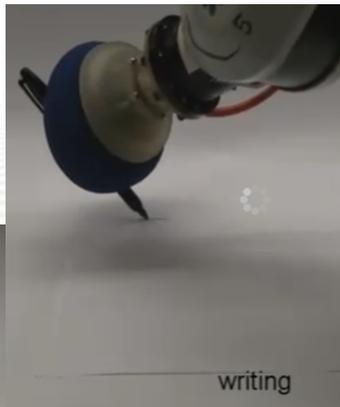
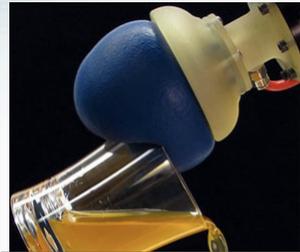
Orchestration of grasping



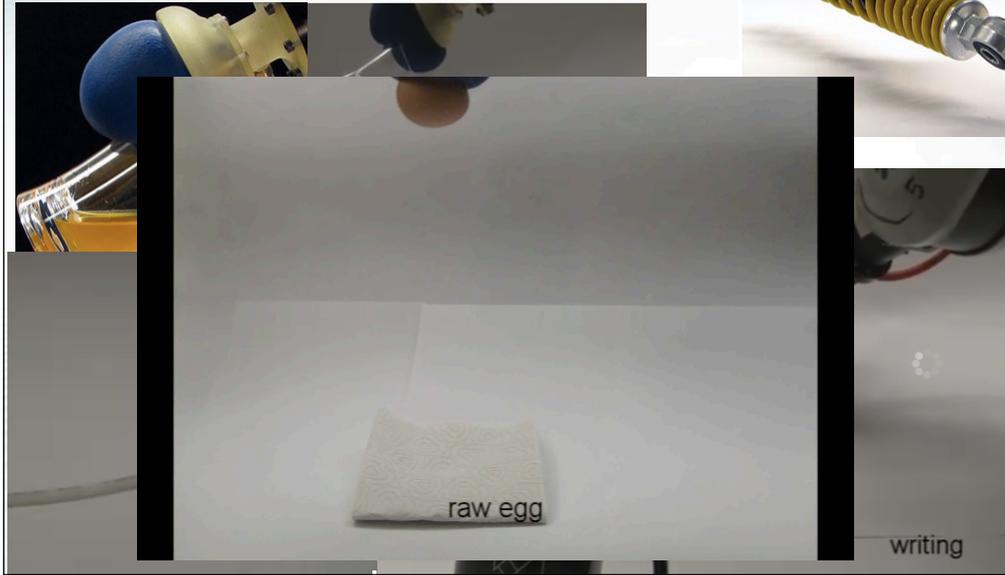
morphological computation:
passive adaptation to shape of object
deformable tissue
induction of sensory stimulation

stably grasping hard object
other manipulation tasks

The Jaeger/Lipson “coffee balloon gripper”



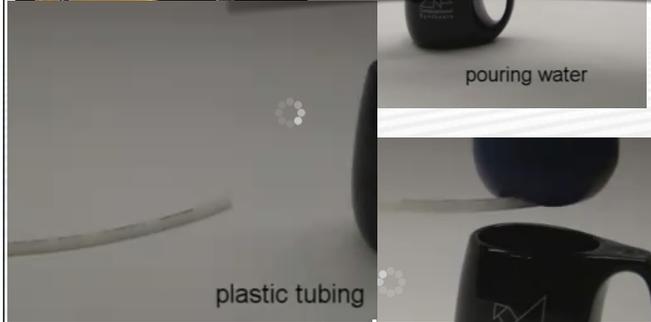
The Jaeger/Lipson “coffee balloon gripper”



The Jaeger/Lipson “coffee balloon gripper”



morphological computation:
passive adaptation
to shape of object
(same “control”)



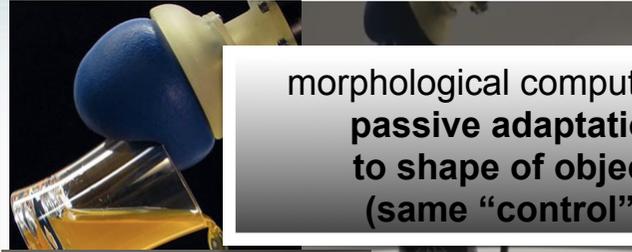
pouring water

plastic tubing



writing

The Jaeger/Lipson “coffee balloon gripper”



morphological computation:
passive adaptation
to shape of object
(same “control”)



“epitome” of soft robotics
and morphological
computation

plastic tubing

writing

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no clear separation between control and hardware (“soft robotics” - compliant legs)

re-thinking of “control”
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 in terms of morphological computation

- exploitation of passive dynamics
- **exploitation of - changeable - material properties**

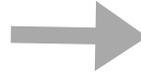
Import for manufacturing - the next industrial revolution

beyond traditional manufacturing:
new manipulation skills

hard robotics



softbots
Robot Companions



new manufacturing
technology

new industrial
revolution

OCTOPUS
arm prototype



Festo Bionic
Handling assistant



ECCE
the super-compliant robot



U-Tokyo
robot "frog"

HEARTLAND
ROBOTICS

Rodney Brooks

adept

YOUR INTELLIGENT ROBOTICS PARTNER

New manipulation skills



Foxconn: 1 mio robots within the next three years

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Optic flow and morphological computation

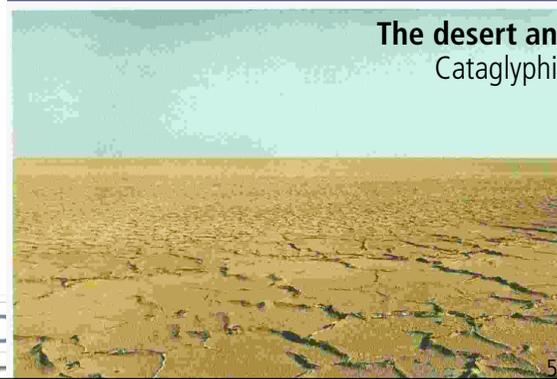
- amazing navigational skills
- fast obstacle avoidance
- learning

photos courtesy
Rüdiger Wehner



photo
P.O. Gustavson

robc



The desert ant
Cataglyphis

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Ecological niche of Cataglyphis; salt pan near Maharès in Southern Tunisia.

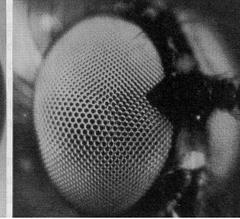
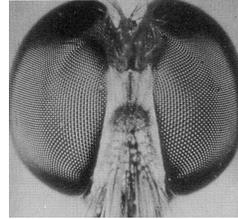
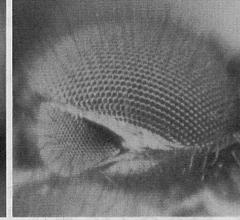
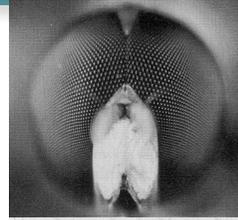
Different morphologies of insect eyes



housefly



large variation of shapes



honey bee



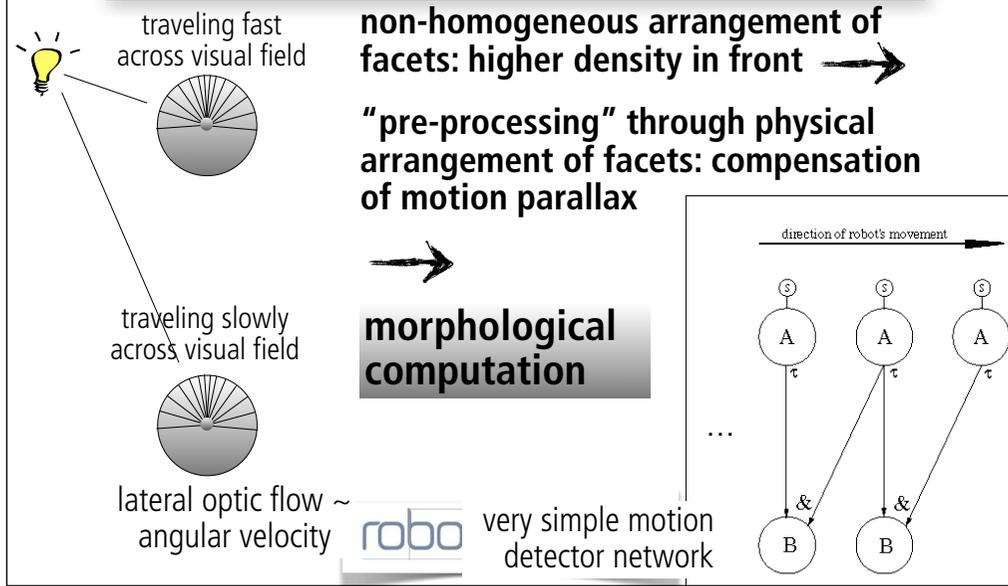
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Motion parallax and sensor morphology

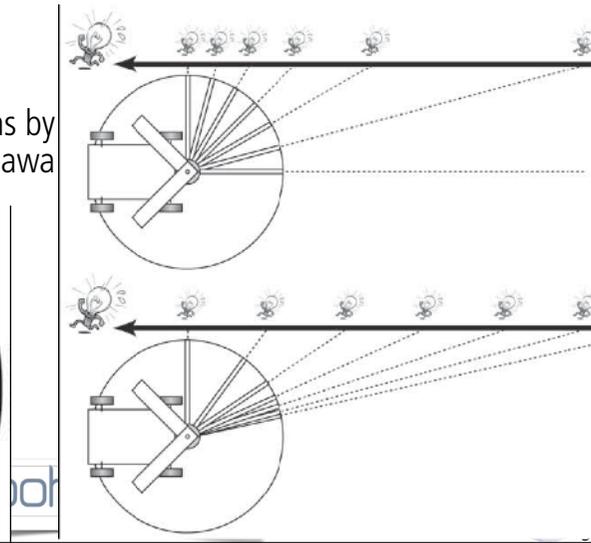
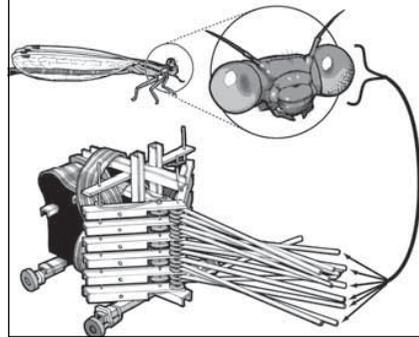


Non-homogenous arrangement of facets --> compensates motion parallaxe.

The "Eyebot" and motion parallax

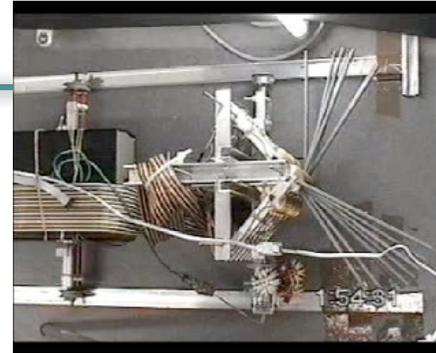
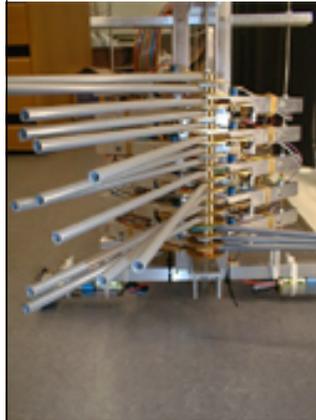
read details in:
"How the body..." p. 131

Cartoons by
Shun Iwasawa



Adaptive behavior through morphology change

“Eyebot”



output from three different runs



Design and construction:
Lukas Lichtensteiger and Peter Eggenberger,
AI Lab, UZH



ai lab



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The “facets” which are tubes with a light-sensitive cell at the end, can be moved individually. The task of the robot was to maintain a fixed lateral distance to a light source. An evolutionary algorithm (see lecture 6) was run that modified the angular positions of the “facets”. The “brain” of the robot, i.e. the controller in the form of a neural network was not changed; the robot had to solve the problem by changing its morphology. If the robot managed to solve the task, nothing was changed, if not, the angular positions of the “facets” were changed (“mutation”). Because of motion parallax, this is a hard problem. The output from three different runs shows that the resulting arrangements are all non-homogeneous, with densities higher in the front.

Motion parallax and sensor morphology: summary

- must know embedding of "brain" (neural circuit) in physical organism
- morphology (physical arrangement of facets): part of "computation" (pre-processing)
- fast, "free"



morphological
computation



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It can also be shown that there is a dependence of learning speed on morphology (because the environment is sampled differently)

Motion parallax and sensor morphology: summary

- must know about the field of "neural circuit" in physical
- morphology of "computational facets": part of "computational facets": part
- fast, "free"

field of
space-variant vision
neuro-morphic
engineering



morphological
computation



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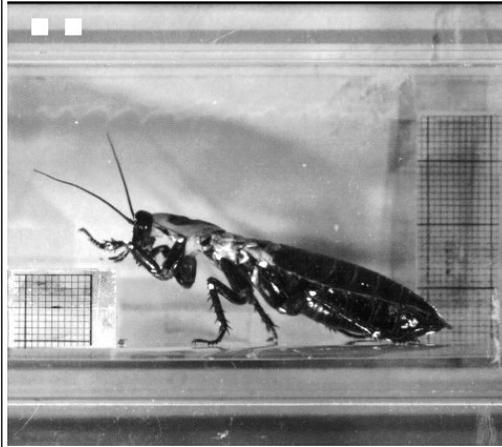
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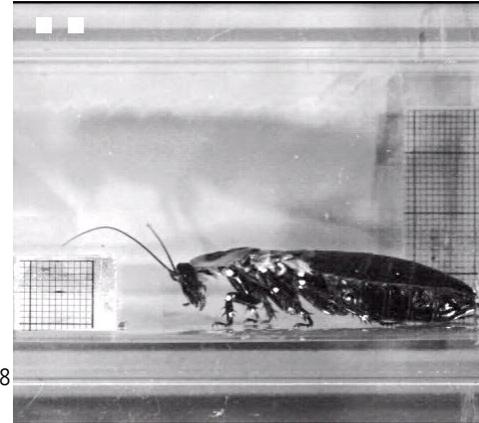
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It can also be shown that there is a dependence of learning speed on morphology (because the environment is sampled differently)

Exploiting morphology: managing complex bodies



pictures and ideas:
courtesy Roy Ritzmann
Case Western Reserve
University



University of Zurich

“Outsourcing” functionality: exploiting morphology

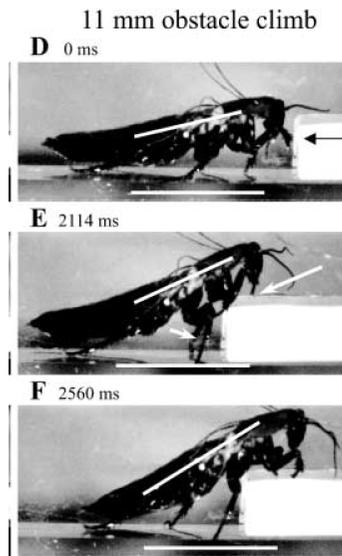
- **brain: 1 Million neurons (rough estimate)**
- **descending neurons: 200 (!)**
- brain:
 - **cooperation with local circuits**
 - **morphological changes (shoulder joint)**

- **Watson, Ritzmann, Zill & Pollack, 2002, J Comp Physiol A**



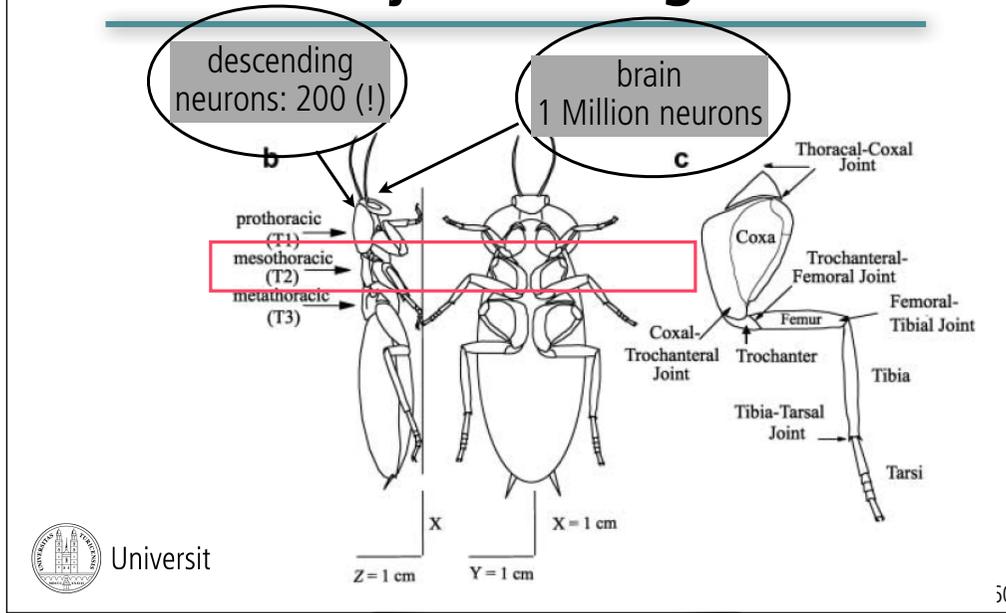
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The following considerations are highly speculative but they make, hopefully, a good story about morphological computation.

Effects of morphology change shoulder joint configuration



rather than recalculating the joint trajectories: changing the mechanical configuration of the mesothoracic shoulder joint (morphological - global - parameter)

Climbing over obstacles

- CPG on flat ground
- get height estimate from antenna
- change configuration of shoulder joint
- CPG continue to function as before (don't "know" about climbing)
- brain-body cooperation



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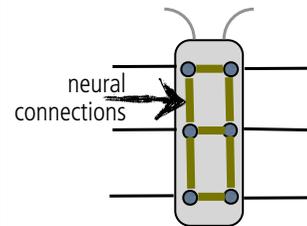
because the mechanical configuration of the shoulder joint is changed, even though the local CPGs continue doing the same thing, the effect on behavior will be different

Insect walking: Information transmission through interaction



Holk Cruse, German biologist

- **no central control for leg-coordination**
- **only communication between neighboring legs**



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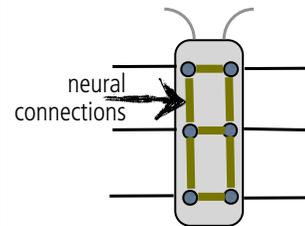


Insect walking



Holk Cruse, German biologist

- **no central control for leg-coordination**
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- **global communication:**



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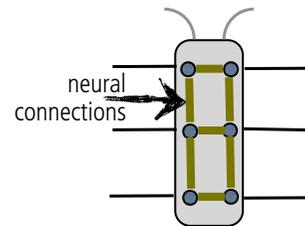


Insect walking



Holk Cruse, German biologist

- **no central control for leg-coordination**
- **only communication between neighboring legs**
- **global communication: through interaction with environment**



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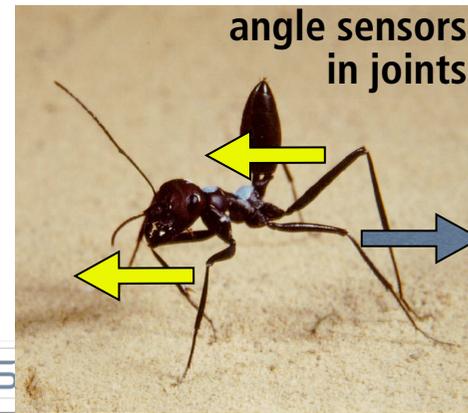
ai lab



Communication through interaction with environment

- exploitation of interaction with environment
→ simpler neural circuits

morphological
computation



University of Zurich

robotics

Contents

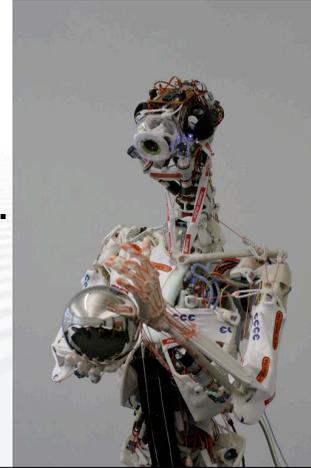
- background and introduction
- morphological computation: examples and case studies
- the “power of materials”
- exploiting sensory morphology
- **information structure through sensory-motor coordination**
- **research challenges**
- **the Swiss perspective**

Induction of “information structure”: the soft, super-compliant humanoid “ECCE”

Generation of sensory stimulation through action

- knowledge about environment: **pressure, haptic, acceleration, vision, ...**
- knowledge about own body: **angle, torque, force, vestibular, ...**

(**ECCE**: Embodied Cognition in a Compliantly Engineered Robot EU-FP7, Cognitive Systems)



Principle 3: Physical dynamics and information structure

Induction of patterns of sensory stimulation through physical interaction with environment

—>

raw material for information processing of brain (control)

—>

induction of correlations (information structure)

—>

predictions/expectation



Induction of information structure through interaction with world

morphological computation:
patterns of sensory stimulation:
dependence on
- morphology
- materials
- action
- environment
induction of information structure

Induction of “information structure”: the soft, super-compliant humanoid “ECCE”



Anthropomorphic design

fully tendon-driven

→ “Bernstein’s problem”

Bernstein's problem: coping with very many degrees of freedom

programming? → complexity barrier

→ developmental approach - learning methods required

- “motor babbling”

- induction of information structure through physical interaction with real world

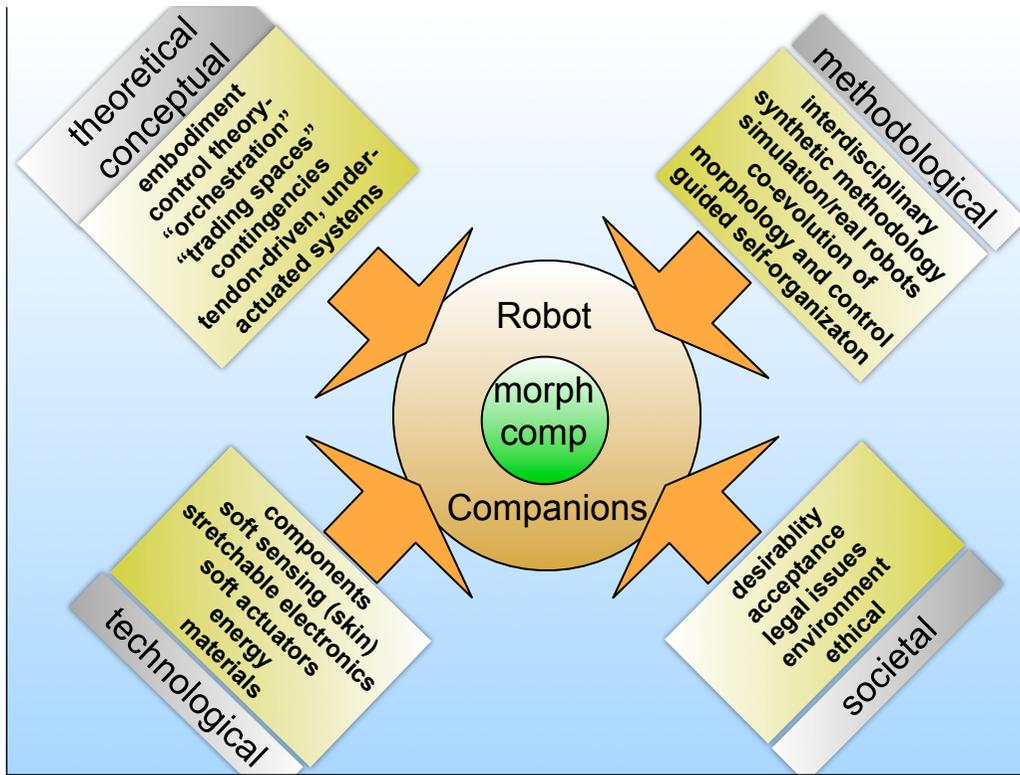
(nice illustration of morphological computation)

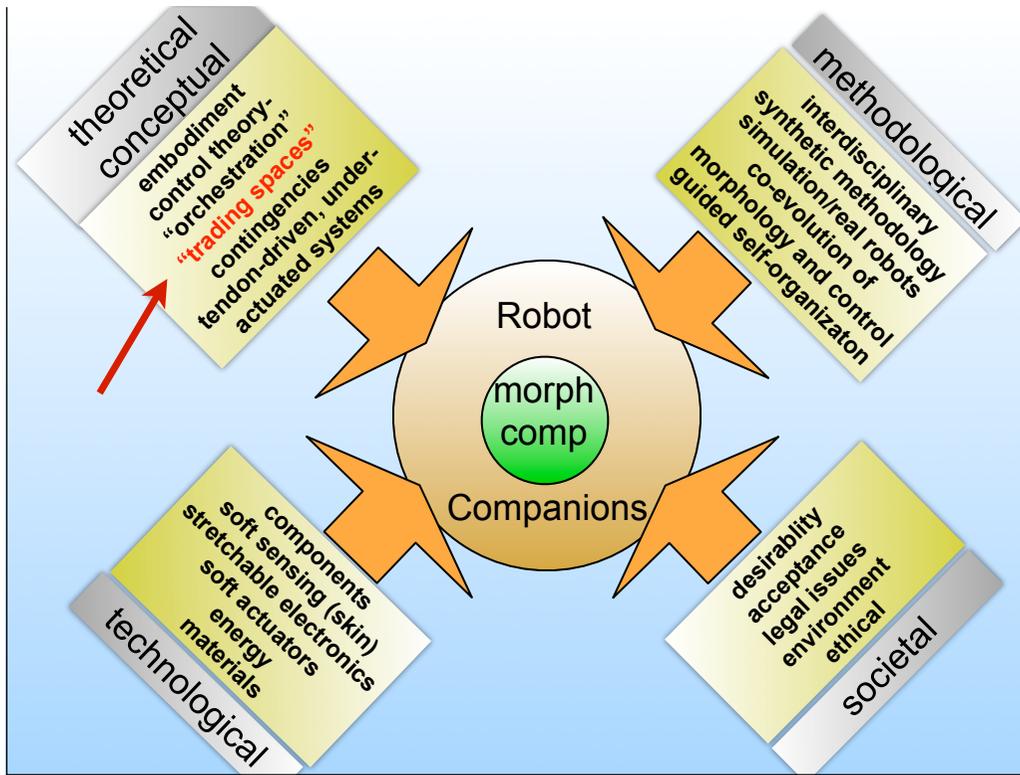
Nikolai Bernstein, Russian Physiologist, 1896 - 1966)



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Expansion of design space: trading spaces and trade-offs

- morphologies (physical structure, distribution of sensors, actuators)
- many materials, functionalities
- changeable characteristics (e.g. stiffness, length, shape, sensor distribution)
- trade-offs: morphology/materials - flexibility (but changeable properties)
- must understand “trading space”: morphology - computation/control
- “orchestration of movement” (partly contained in morphology and materials)

Morphology and computation: “trading spaces”

increasing dominance of morphology and materials

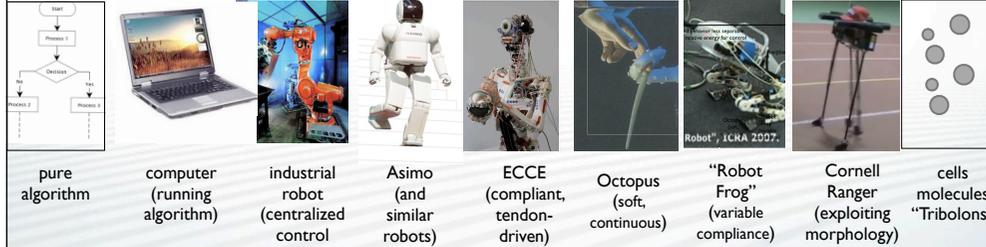
informational computation

control and behavior less separable
decreasing relative energy for control

morphological computation

control dominant

morphology and materials dominant



Morphology and computation: "trading spaces"

increasing dominance of morphology and materials

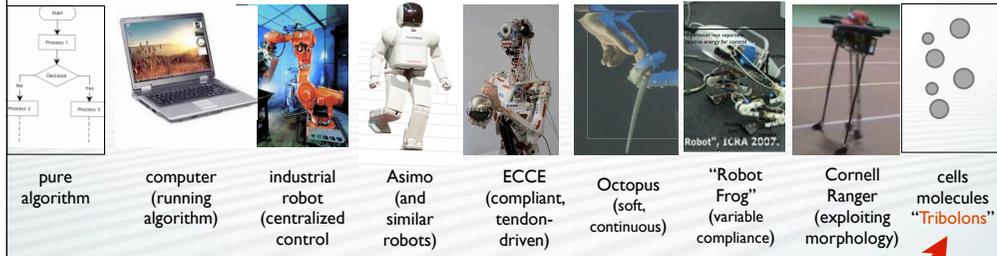
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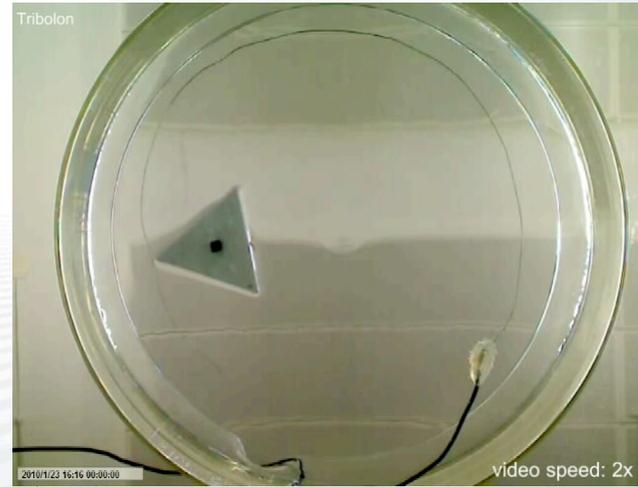
control dominant

morphology and materials dominant



Morphological computation: self-assembly and emergent functionality

“The self-assembled, emergent bicylce”



Design and construction:
Shuhei Miyashita
(Zurich AI Lab, and CMU)

Morphological computation: self-assembly and emergent functionality

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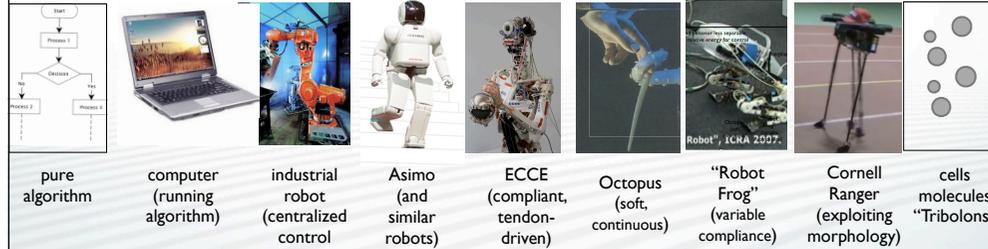
informational computation

control and behavior less separable
decreasing relative energy for control

morphological computation

control dominant

morphology and materials dominant



Mind set: “Design for emergence”

given a set of desired behaviors, design a robot/device:

- **morphology (shape, sensor distribution, materials [possibly changeable], actuation)**
- **neural system (“control”, “orchestration”)**

such that its behavior emerges from morphology, materials, and “control”/ “orchestration”

(always with soft machines)

Summary of morphological computation principles

must understand:

- **physical embedding and information processing (principle 1)**
 - **task distribution (morphology, materials, control, environment) and embedding (principle 2)**
 - **induction of information structure through interaction with real world (principle 3)**
- > **exploitation of embodiment**

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**Intelligent robots
for improving the
quality of life**

[Version Française](#)

The National Centre of Competence in Research (NCCR) Robotics is a nation-wide center, launched by the [Swiss National Science Foundation](#), with the common objective of developing new, human-oriented robotic technology for improving our quality of life.

This center gathers leading robotic experts in Switzerland from cutting-edge research institutions: [EPFL](#) as the home institution, [ETH Zurich](#), [University of Zurich](#) and [Dalle Molle Institute for Artificial Intelligence](#). Launched on 1 December 2010, the NCCR Robotics will run for up to twelve years.

The NCCR Robotics brings together Swiss robotic research and aims to generate long-term benefits to society as a whole. Through this website, we would like to establish two-way communication about robotics in Switzerland and abroad with researchers, students, teachers, industries, and the general public.

Home institution



Partners



Highlights

[Robots in Daily life - NCCR Robotics 1st Symposium](#)

16 June 2011, ETH Zurich
Registration is now closed. We will re-open the registration again if any seats become available.

[Europe shortlisted Robotics Flagship](#)

Project *Robot Companions for Citizens* has been chosen among six other *grand challenges* by European Commission in Budapest. This project aims at developing *sentient machines* whose applications include helping elderly people or rescuing people in natural disasters.

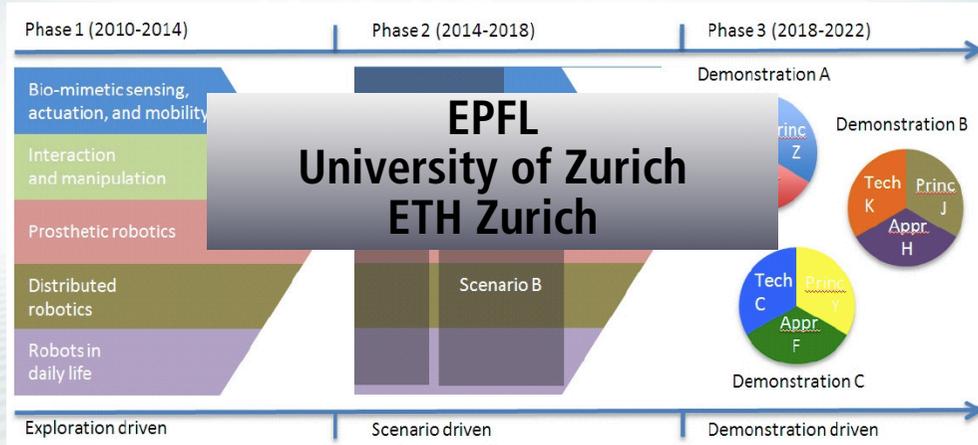
[Summer School - Dynamic Walking and Running with Robots](#)

11-15 July 2011, ETH Zurich

[Login](#)

NCCR - Robotics 12 year perspective

Director:
Prof. Dario Floreano, EPFL



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ROBOTS ON TOUR

World Congress and Exhibition of Robots, Humanoids, Cyborgs and more

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World Congress and Exhibition of Robots, Humanoids, Cyborgs and more 9th March 2013 in Zurich

“On the occasion of the 25th anniversary of the Artificial
Intelligence Laboratory, University of Zurich”

The aim of the „World Congress and Exhibition of Robots, Humanoids, Cyborgs, and more“ is

News

03.04.2012: Start of the ticket
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