

# Lecture 5. Mc, self-organization of behaviors and adaptive morphologies



Fabio Bonsignorio

The BioRobotics Institute, SSSA, Pisa, Italy and Heron Robots

THE BIOROBOTICS  
INSTITUTE



Scuola Superiore  
Sant'Anna



# Older and newer attempts

**Juanelo Torriano alias Gianello della Torre, (XVI century)** a craftsman from Cremona, built for Emperor Charles V a mechanical young lady who was able to walk and play music by picking the strings of a real lute.



**Hiroshi Ishiguro, early XXI century**

Director of the Intelligent Robotics Laboratory,  
part of the Department of Adaptive Machine  
Systems at Osaka University, Japan

# The need for an embodied perspective

---

- **“failures” of classical AI**
- **fundamental problems of classical approach**
- **Wolpert’s quote: Why do plants not have a brain? (but check Barbara Mazzolai’s lecture at the ShanghAI Lectures 2014)**
- **Interaction with environment: always mediated by body**



# Two views of intelligence

classical:  
**cognition as computation**



embodiment:  
**cognition emergent from sensory-  
motor and interaction processes**

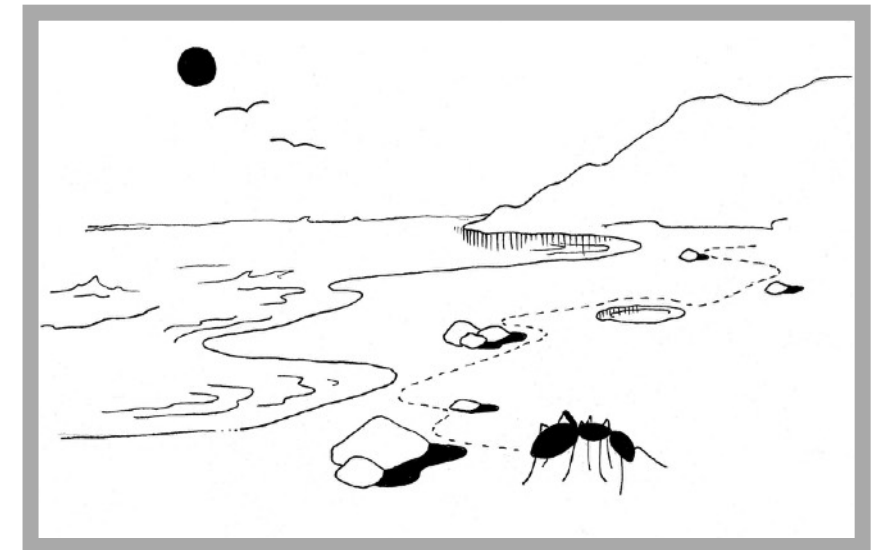




# “Frame-of-reference”

## Simon’s ant on the beach

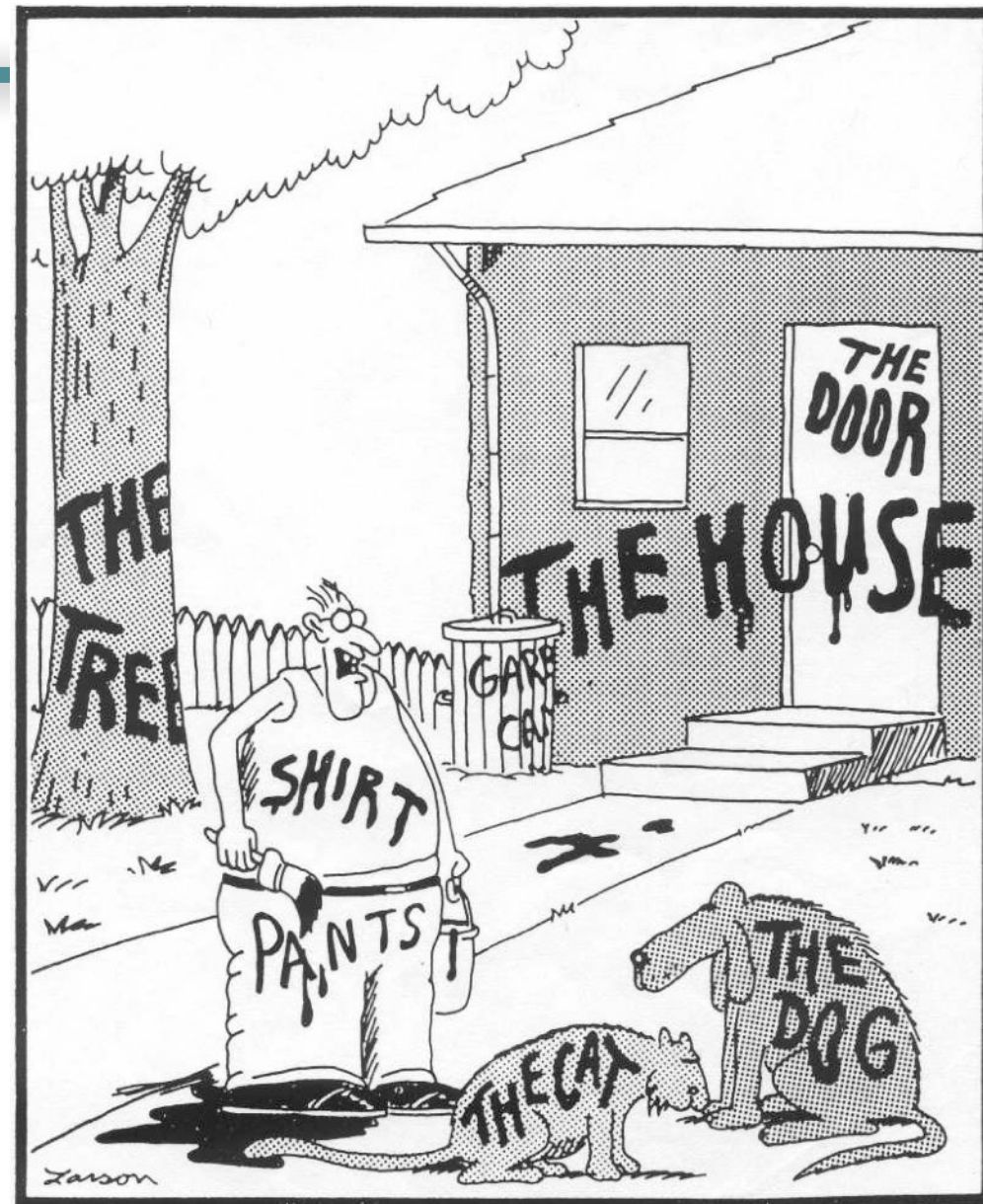
- **simple behavioral rules**
- **complexity in interaction,  
not — necessarily — in brain**
- **thought experiment:  
increase body by factor of 1000**



# The “symbol grounding” problem

real world:  
doesn't come  
with labels ...

How to put the  
labels??



"Now! ... That should clear up  
a few things around here!"

Gary Larson

# Complete agents

Masano Toda's  
Fungus Eaters



# Properties of embodied agents

---

- **subject to the laws of physics**
- **generation of sensory stimulation through interaction with real world**
- **affect environment through behavior**
- **complex dynamical systems**
- **perform morphological computation**



# Complex dynamical systems

---

**non-linear system -  
in contrast to a linear one  
—> Any idea?**

# Complex dynamical systems

---

**concepts: focus box 4.1, p. 93, “How the body ...”**

- **dynamical systems, complex systems, non-linear dynamics, chaos theory**
- **phase space**
- **non-linear system — limited predictability, sensitivity to initial conditions**
- **trajectory**

# Today's topics

---

- short recap
- characteristics of complete agents
- **illustration of design principles**
- parallel, loosely coupled processes: the “subsumption architecture”
- case studies: “Puppy”, biped walking
- “cheap design” and redundancy

# Design principles for intelligent systems

---

**Principle 1: Three-constituents principle**

**Principle 2: Complete-agent principle**

**Principle 3: Parallel, loosely coupled processes**

**Principle 4: Sensory-motor coordination/ information self-structuring**

**Principle 5: Cheap design**

**Principle 6: Redundancy**

**Principle 7: Ecological balance**

**Principle 8: Value**



# Three-constituents principle

---

define and design

- **“ecological niche”**
- **desired behaviors and tasks**
- **design of agent itself**

design stances

scaffolding

# Complete-agent principle

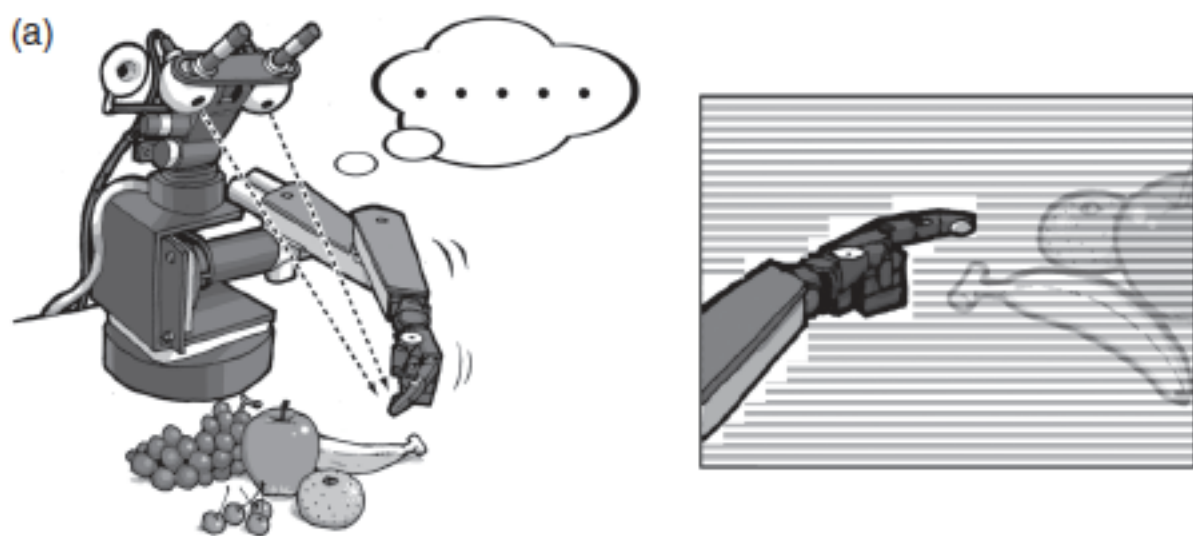
---

- **always think about complete agent behaving in real world**
- **isolated solutions: often artifacts — e.g., computer vision (contrast with active vision)**
- **biology/bio-inspired systems: every action has potentially effect on entire system**



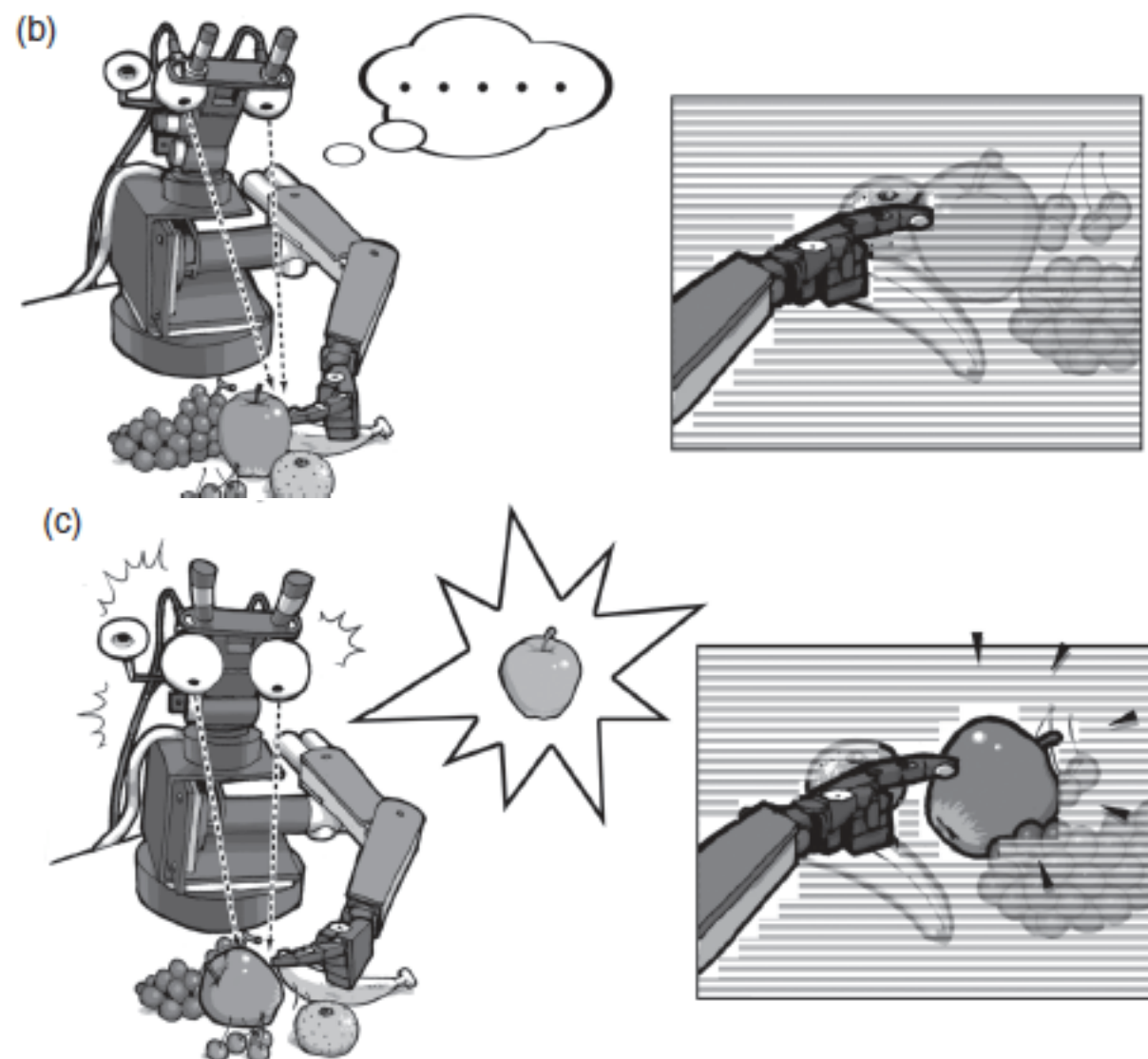
**can be exploited!**

# Recognizing an object in a cluttered environment



**manipulation of  
environment can  
facilitate perception**

**Experiments: Giorgio Metta  
and Paul Fitzpatrick**



Illustrations by Shun Iwasawa

# Today's topics

---

- short recap
- characteristics of complete agents
- illustration of design principles
- **parallel, loosely coupled processes: the “subsumption architecture”**
- case studies: “Puppy”, biped walking
- “cheap design” and redundancy



# Parallel, loosely coupled processes

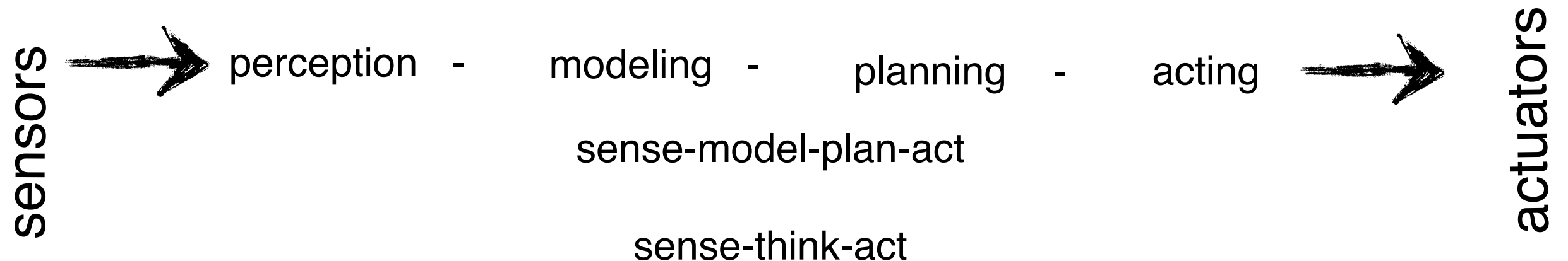
---

intelligent behavior:

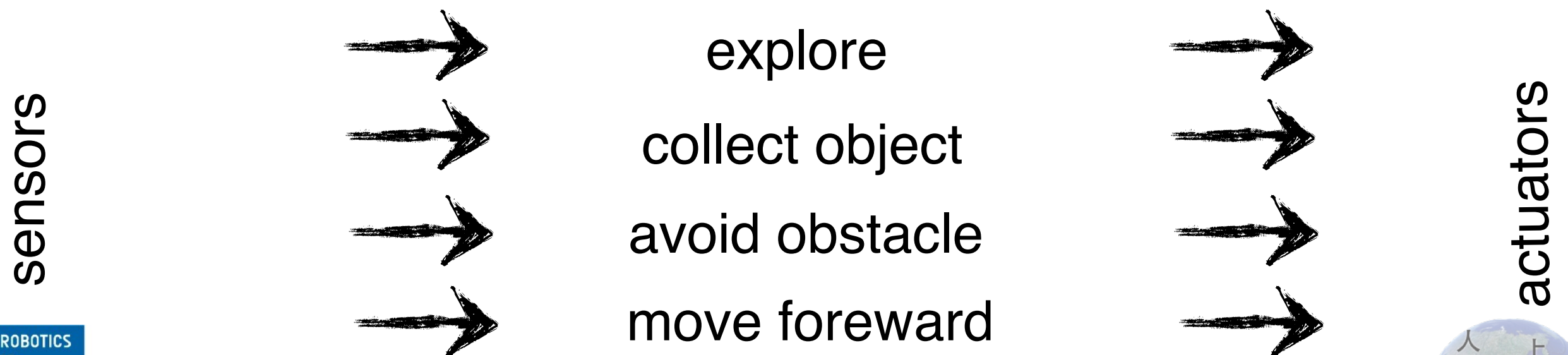
- **emergent from system-environment interaction**
- **based on large number of parallel, loosely coupled processes**
- **asynchronous**
- **coupled through agent's sensory-motor system and environment**

# The subsumption architecture

## classical, cognitivist



## “behavior-based”, subsumption

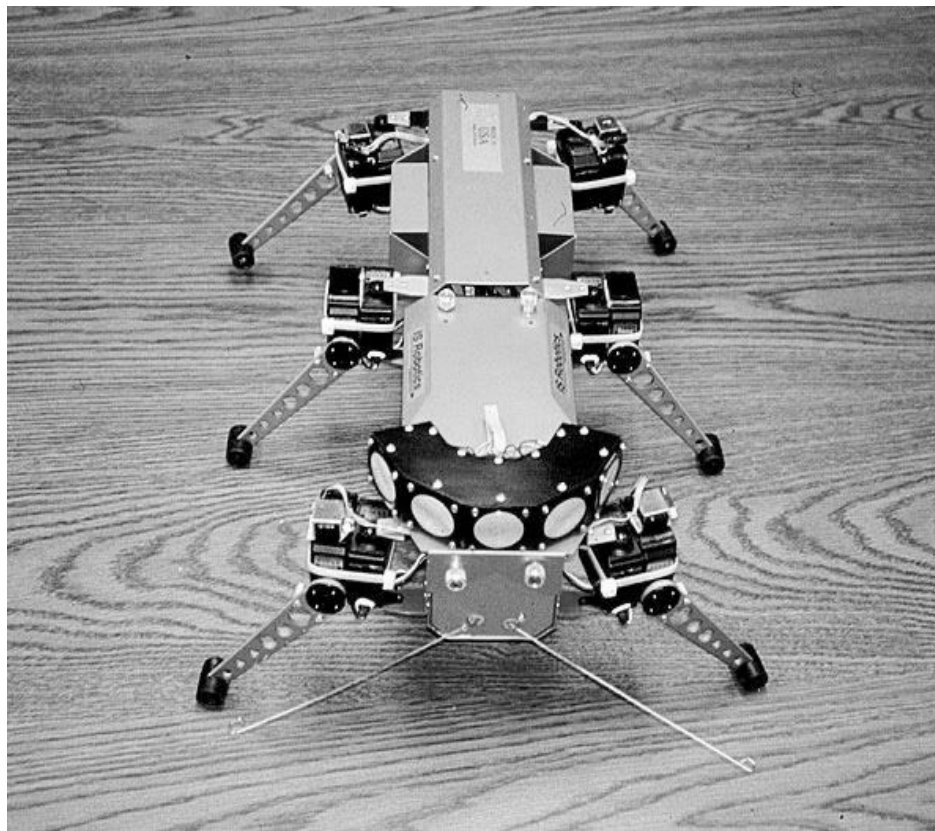


# Mimicking insect walking

---

- **subsumption architecture  
well-suited**

six-legged robot “Ghenghis”



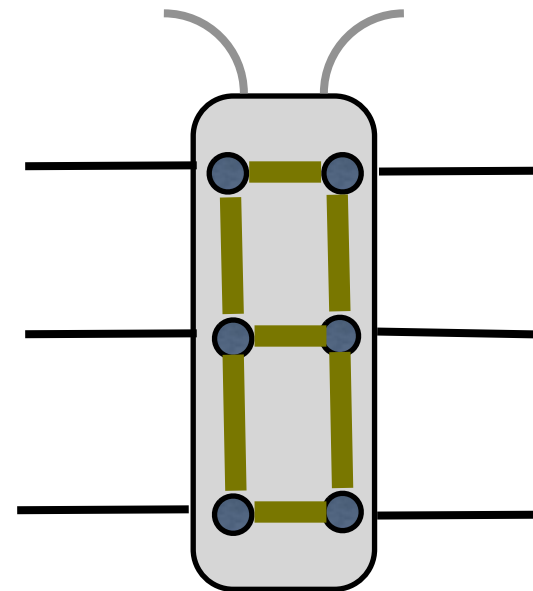
# Insect walking



Holk Cruse, German biologist

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

neural connections





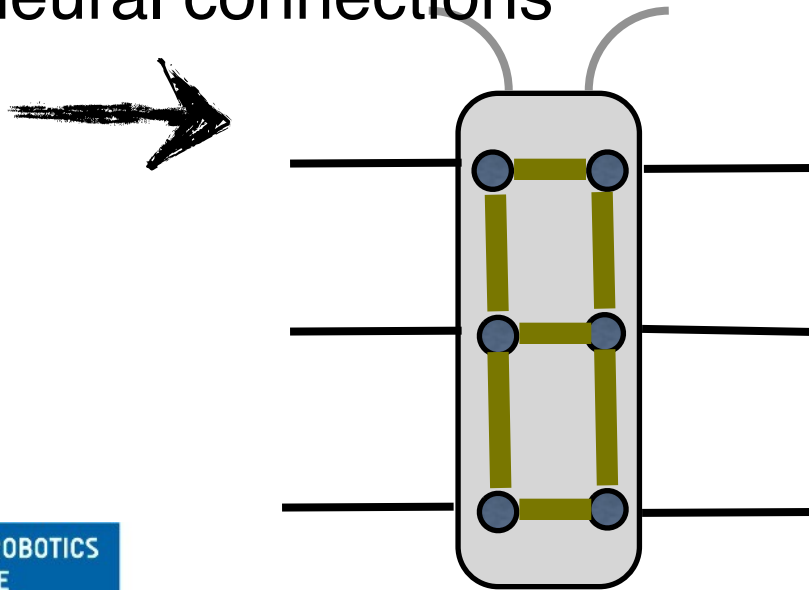
# Insect walking



Holk Cruse, German biologist

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

neural connections



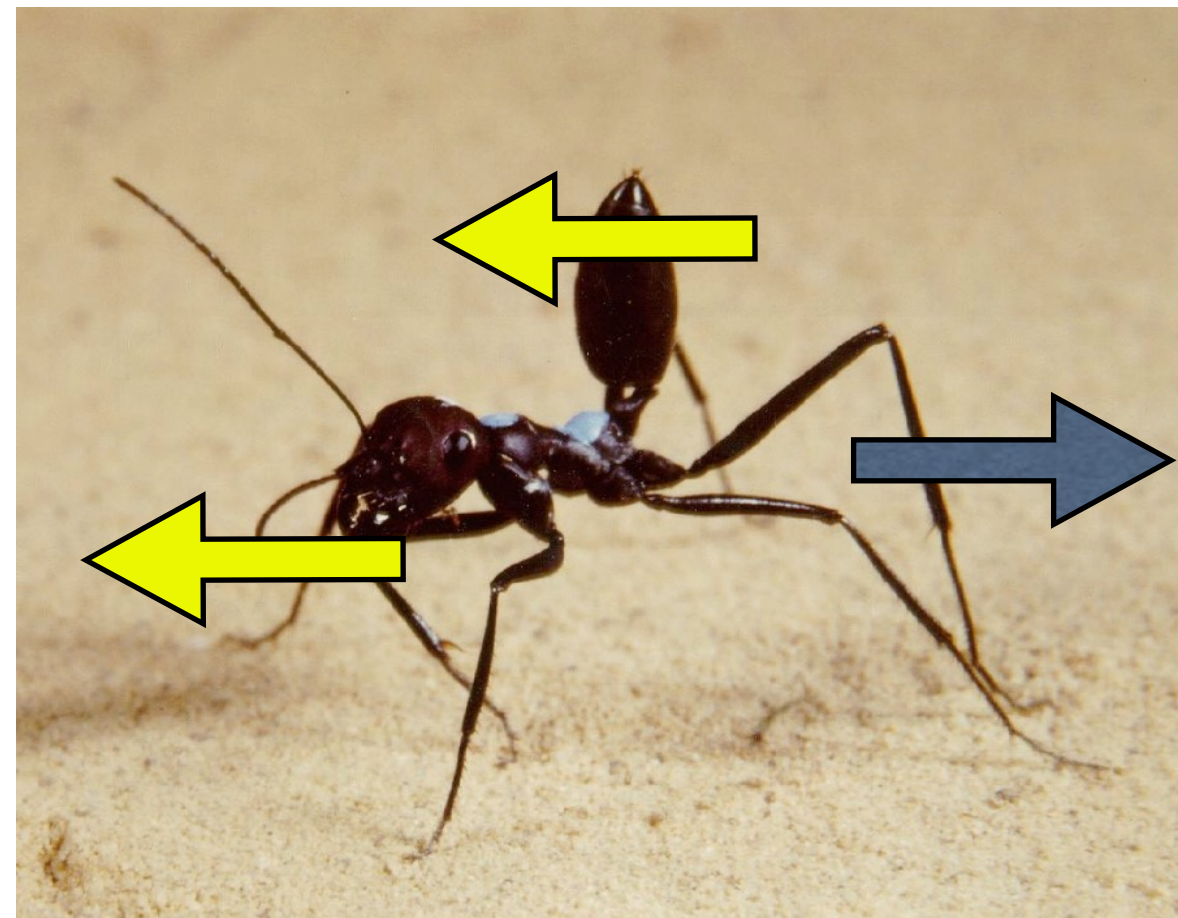
# Communication through interaction with

- exploitation of interaction with environment

→ simpler neural circuits

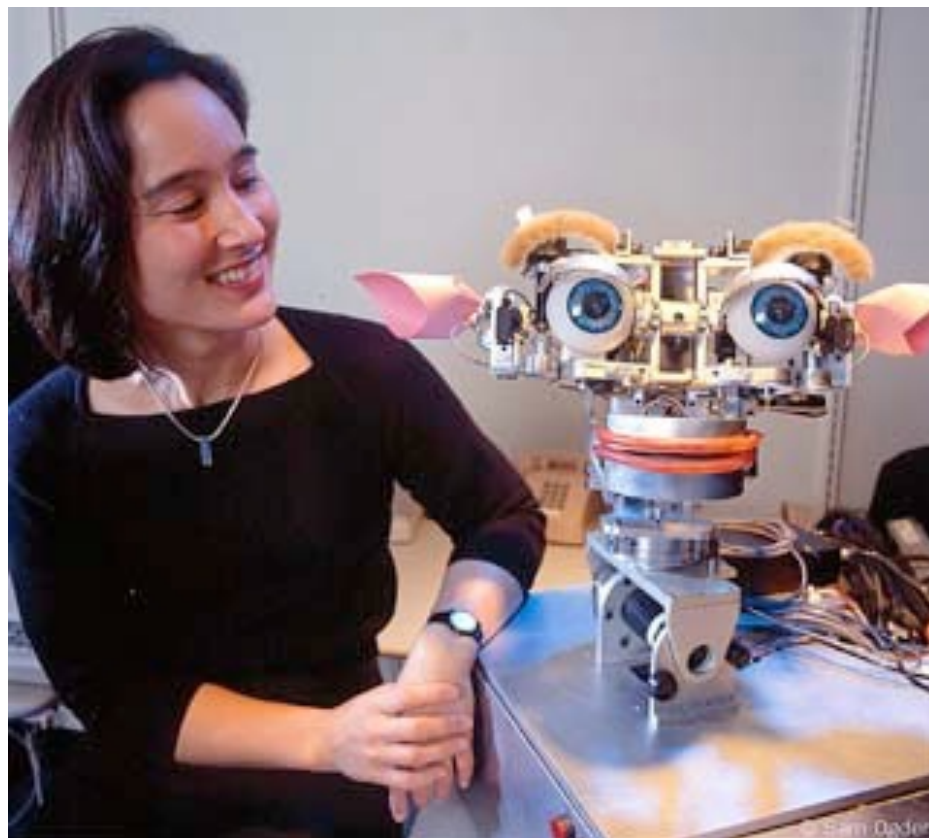
angle sensors  
in joints

“parallel, loosely  
coupled  
processes”



# Kismet: The social interaction robot

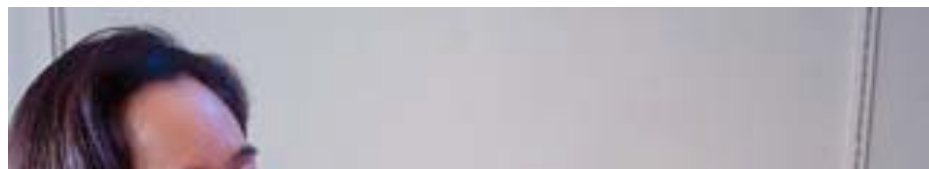
---



Cynthia Breazeal, MIT Media Lab  
(prev. MIT AI Lab)

# Kismet: The social interaction robot

---



Video “Kismet”



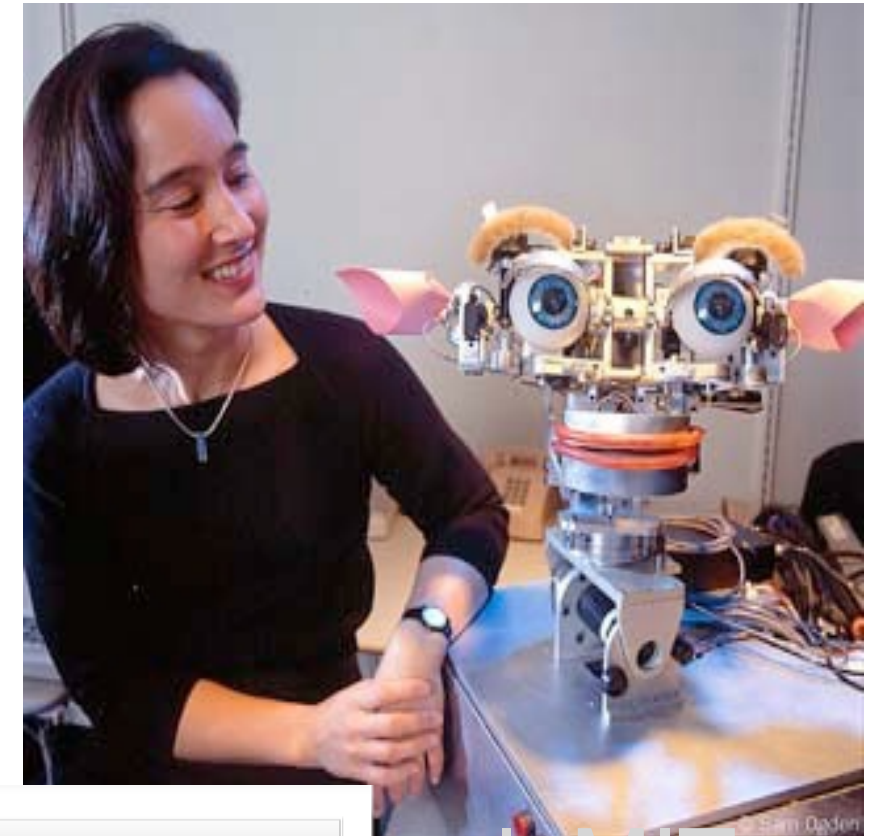
Cynthia Breazeal, MIT Media Lab  
(prev. MIT AI Lab)



# Kismet: The social interaction robot

Reflexes:

- turn towards loud noise
- turn towards moving objects
- follow slowly moving objects
- habituation



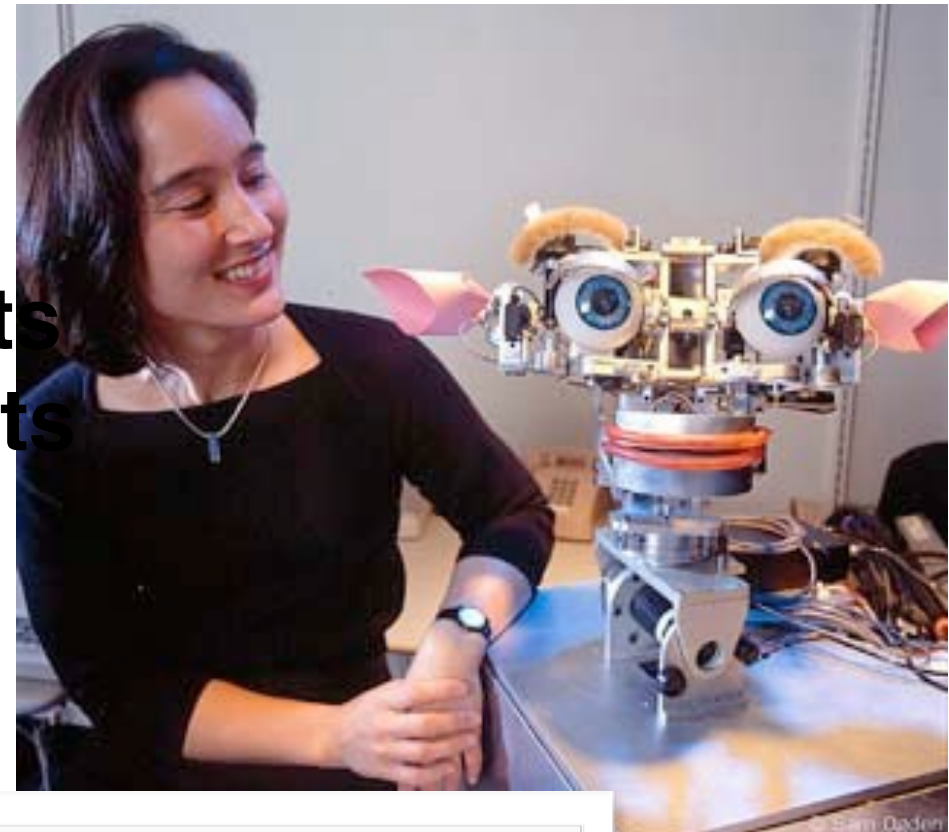
principle of “parallel, loosely coupled processes”



# Kismet: The social interaction robot

Reflexes:

- turn towards loud noise
- turn towards moving objects
- follow slowly moving objects
- habituation



social competence: a collection of reflexes ?!?!???

# Scaling issue: the “Brooks-Kirsh” debate

---

**insect level → human level?**

**David Kirsh (1991): “Today the earwig, tomorrow man?”**

**Rodney Brooks (1997): “From earwigs to humans.”**

# Scaling issue: the “Brooks-Kirsh” debate

---

insect level → human level?

David Kirsh (1991). “Today, the service man?”

Rodney Brooks (1991). “Human volunteers for brief presentation on the ‘Brooks-Kirsh’ debate - or generally, scalability of subsumption (on a later date)”

tomorrow  
to

# Today's topics

---

- short recap
- characteristics of complete agents
- illustration of design principles
- parallel, loosely coupled processes: the subsumption architecture”
- **case studies: “Puppy”, biped walking**
- “cheap design” and redundancy

# Case study: “Puppy” as a complex dynamical

---

- **running: hard problem**
- **time scales: neural system — damped oscillation of knee-joint**
- **“outsourcing/offloading” of functionality to morphological/material properties**

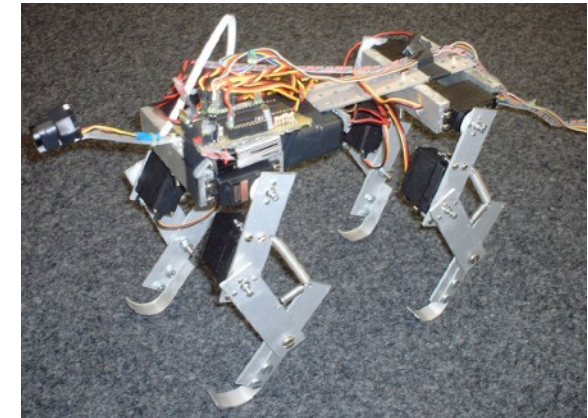


morphological  
computation

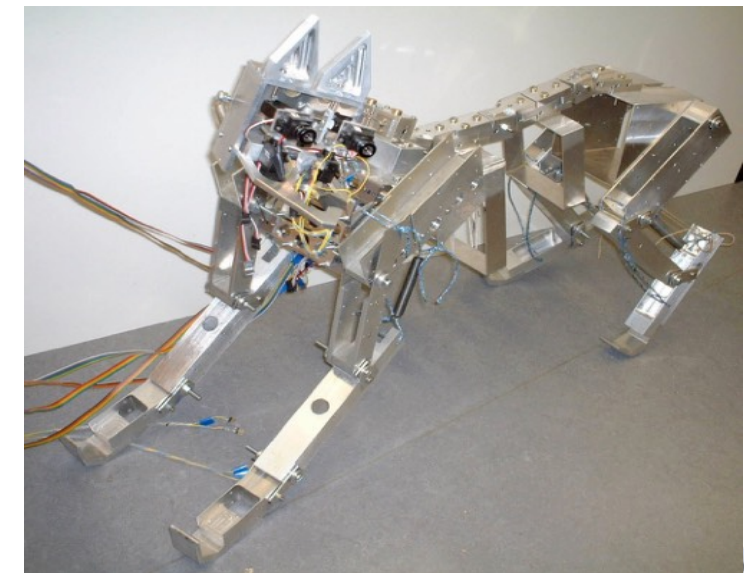


# Recall: “Puppy’s” simple control

**rapid locomotion in biological systems**



**recall: emergence of behavior**



Design and construction:

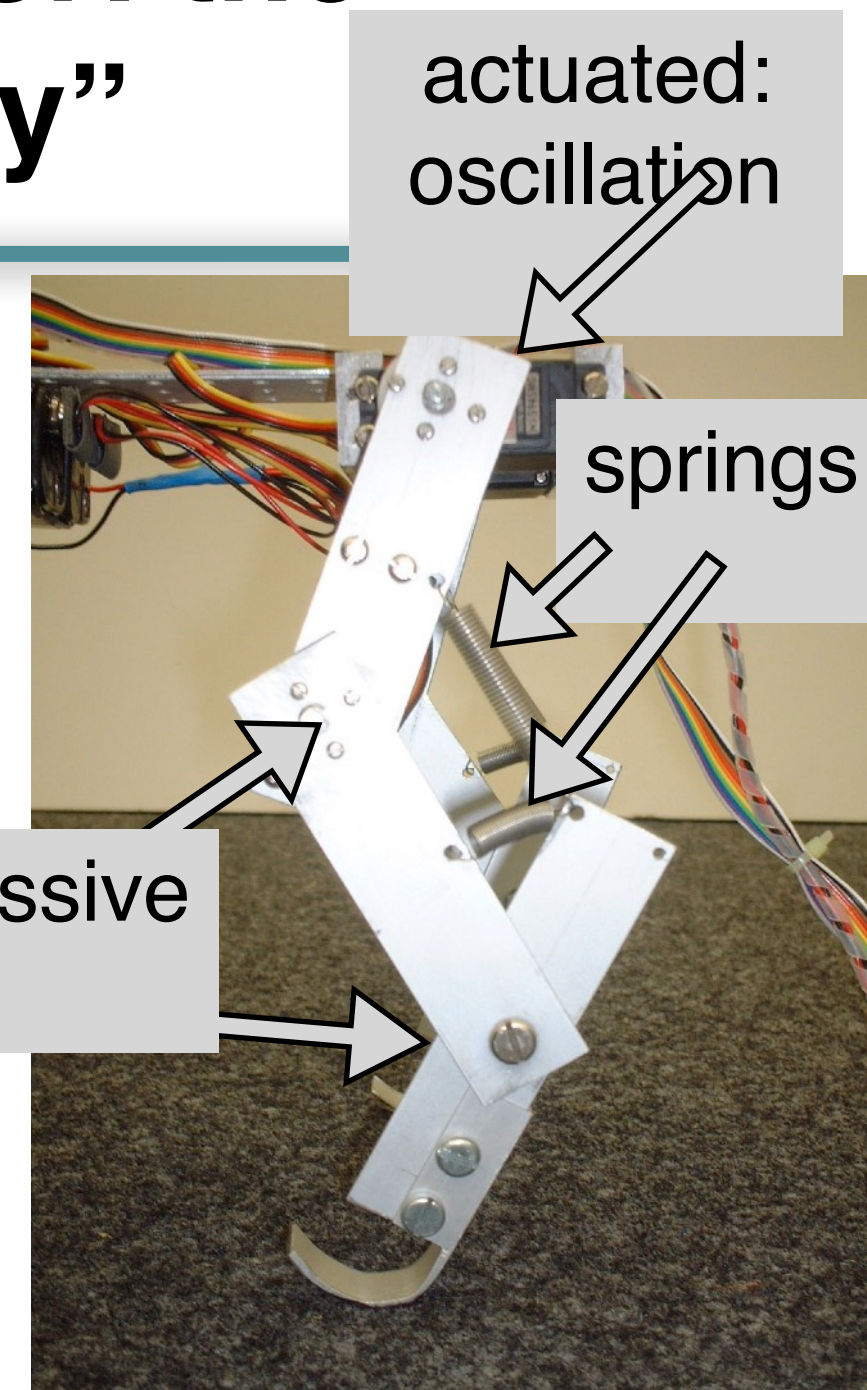
**Fumiya Iida, AI Lab, UZH and ETH-Z**

# Emergence of behavior: the quadruped “Puppy”

- **simple control (oscillations of “hip” joints)**
- **spring-like material properties (“under-actuated” system)**
- **self-stabilization, no sensors**
- **“outsourcing” of functionality**



morphological  
computation



# Self-stabilization: “Puppy” on a treadmill

---

Video “Puppy” on treadmill

# Self-stabilization: “Puppy” on a treadmill

Video “Puppy” on treadmill  
slow motion

- **no sensors**
- **no control**



**self-  
stabilization**

# Self-stabilization: “Puppy” on a treadmill

Video “Puppy” on treadmill  
slow motion

- **no sensors**
- **no control**



self-  
stabilization

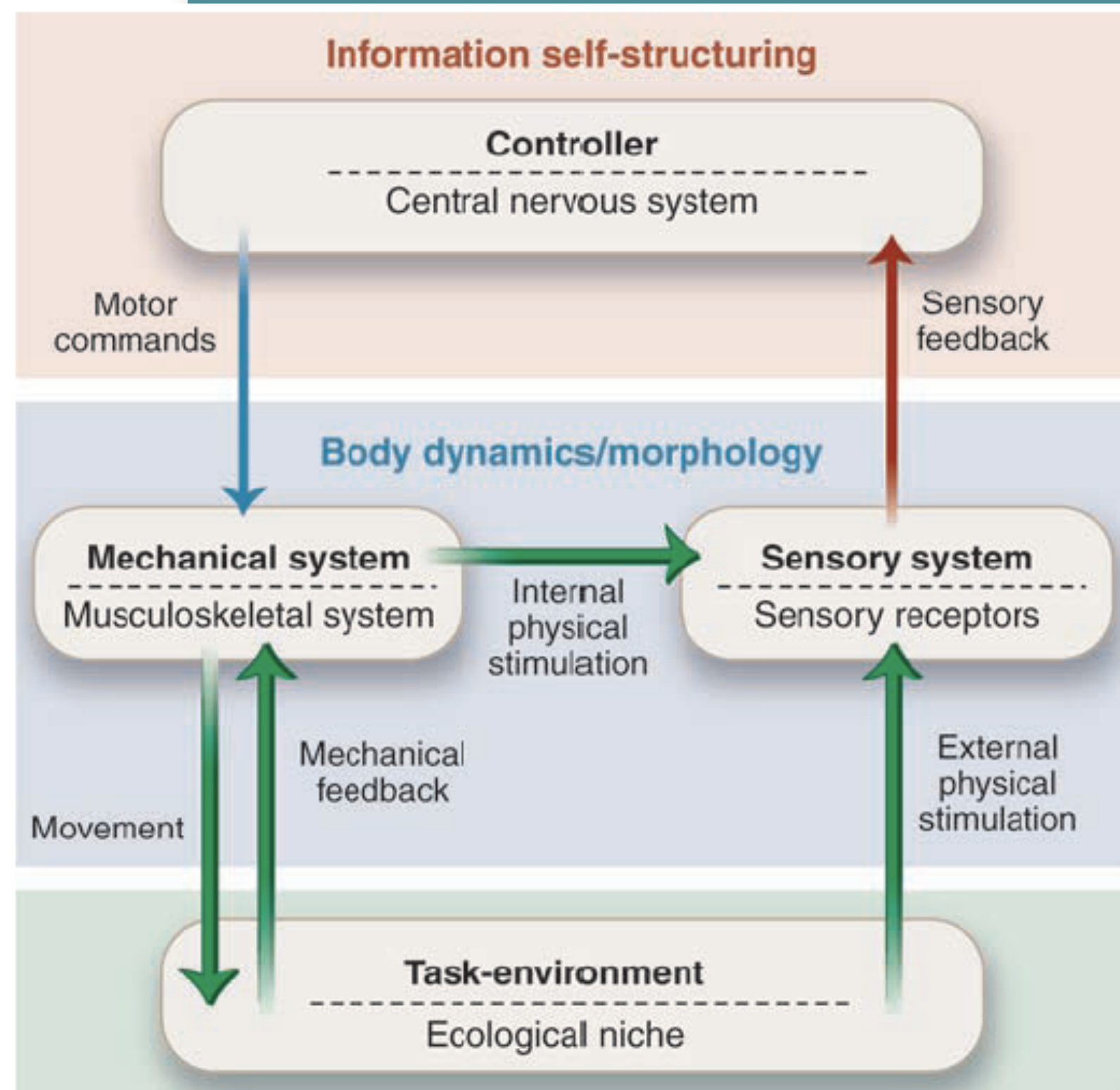
principle of  
“cheap  
design”



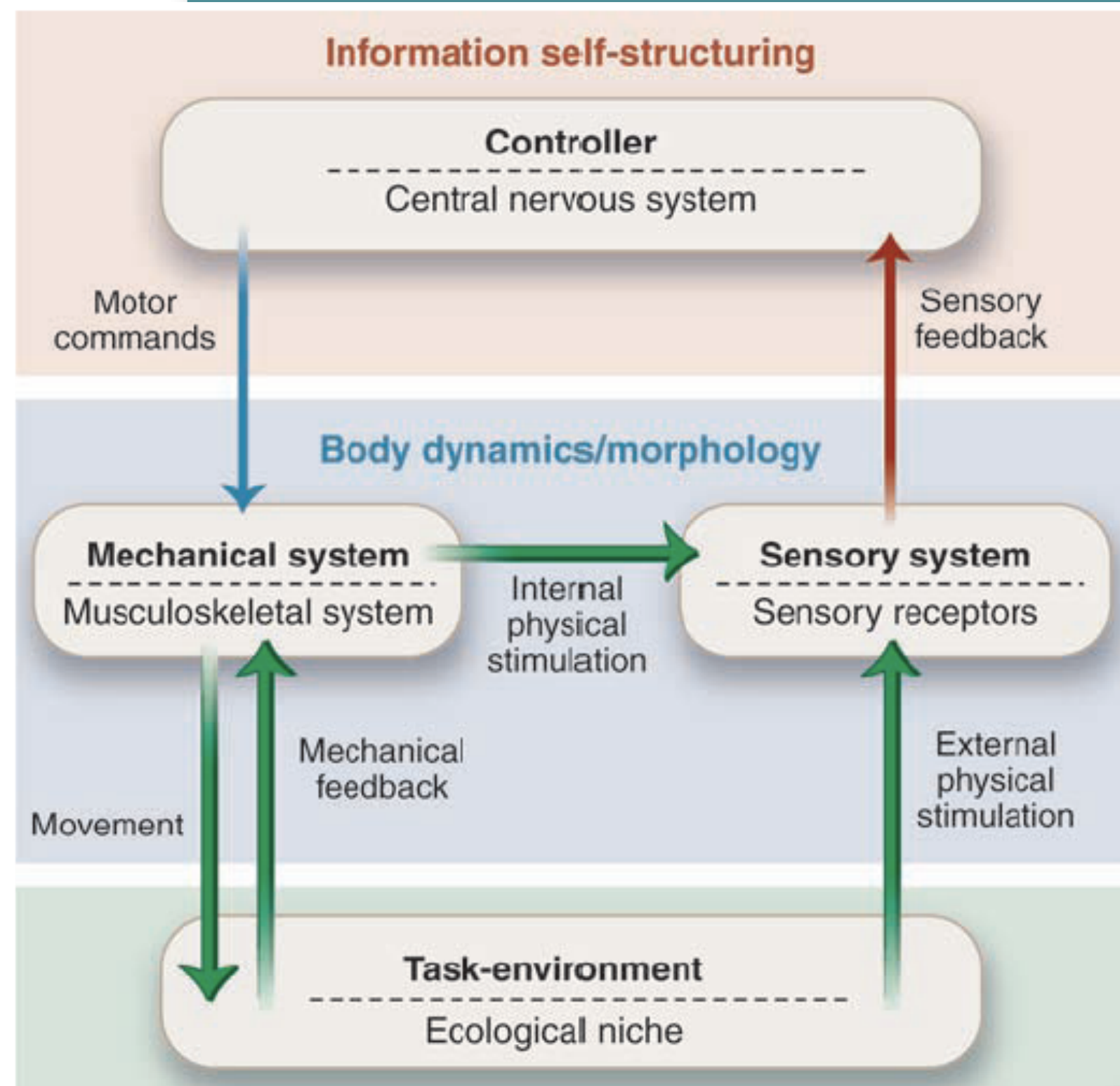
# Implications of embodiment

“Puppy”

Pfeifer et al., Science,  
16 Nov. 2007



# Implications of embodiment



“Puppy”

which part of diagram is relevant?

—>

Pfeifer et al., Science, 16 Nov. 2007



# Probabilistic Model Of Control

---

- Although it may seem strange only in recent times the classical results from Shannon theory, have been applied to the modeling of control systems.
- As the complexity of control tasks namely in robotics applications lead to an increase in the complexity of control programs, it becomes interesting to verify if, from a theoretical standpoint, there are limits to the information that a control program must manage in order to be able to control a given system.



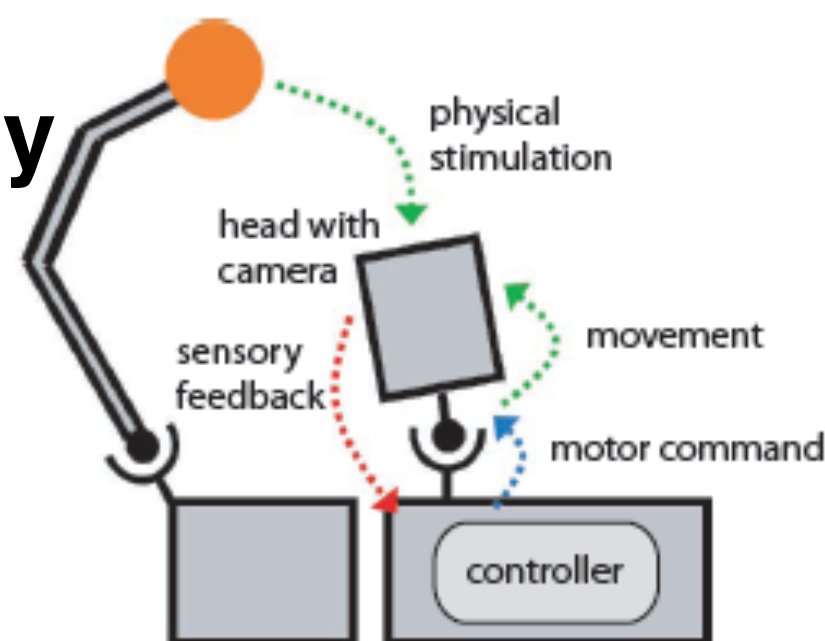
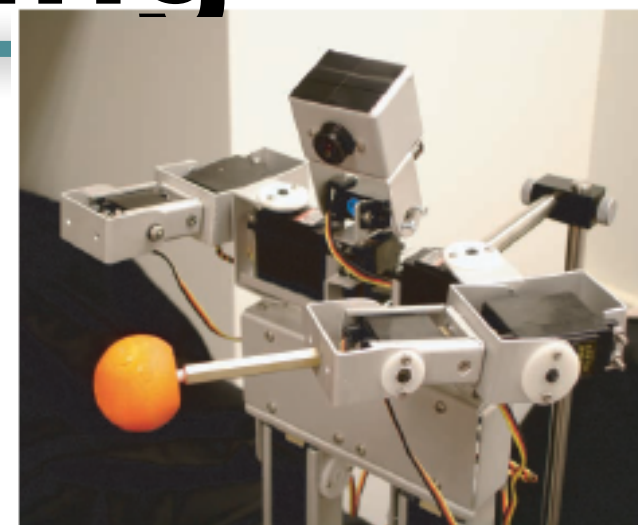
# Information self-structuring

Experiments:

Lungarella and Sporns, 2006

**Mapping information flow  
in sensorimotor networks**

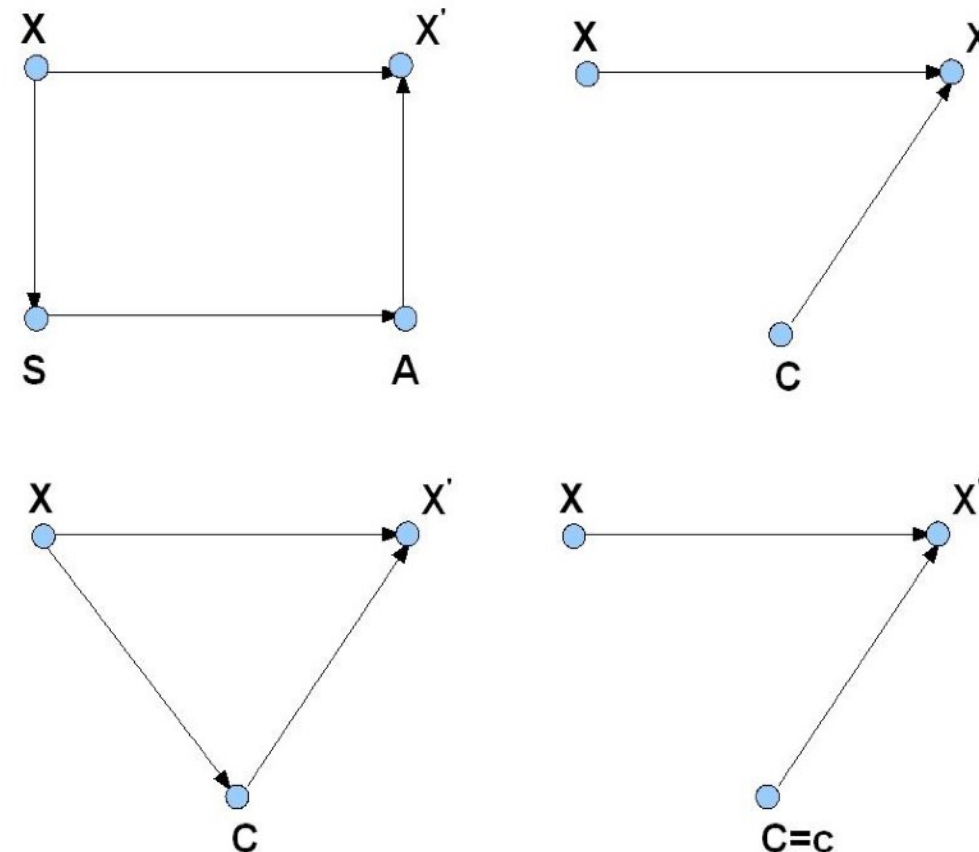
**PLoS Computational Biology**





# Probabilistic Model Of Control

Touchette,  
Lloyd (2004)



Directed acyclic graphs representing a control process. (Upper left) Full control system with a sensor and an actuator. (Lower left) Shrunk Closed Loop diagram merging sensor and actuator, (Upper right) Reduced open loop diagram. (Lower right) Single actuation channel enacted by the controller's state  $C=c$ .





# Models of 'Morphological Computation'

---

$$K(X) \leq \log \frac{W_{closed}}{W_{open}} \quad (I)$$

Relation (I) links the complexity ('the length') of the control program of a physical element to the state available in closed loop and the non controlled condition.  
This show the benefits of designing stuctures whose 'basin of attractions' are close to the desired behaviors in the phase space.



# Models of ‘Morphological Computation’

---

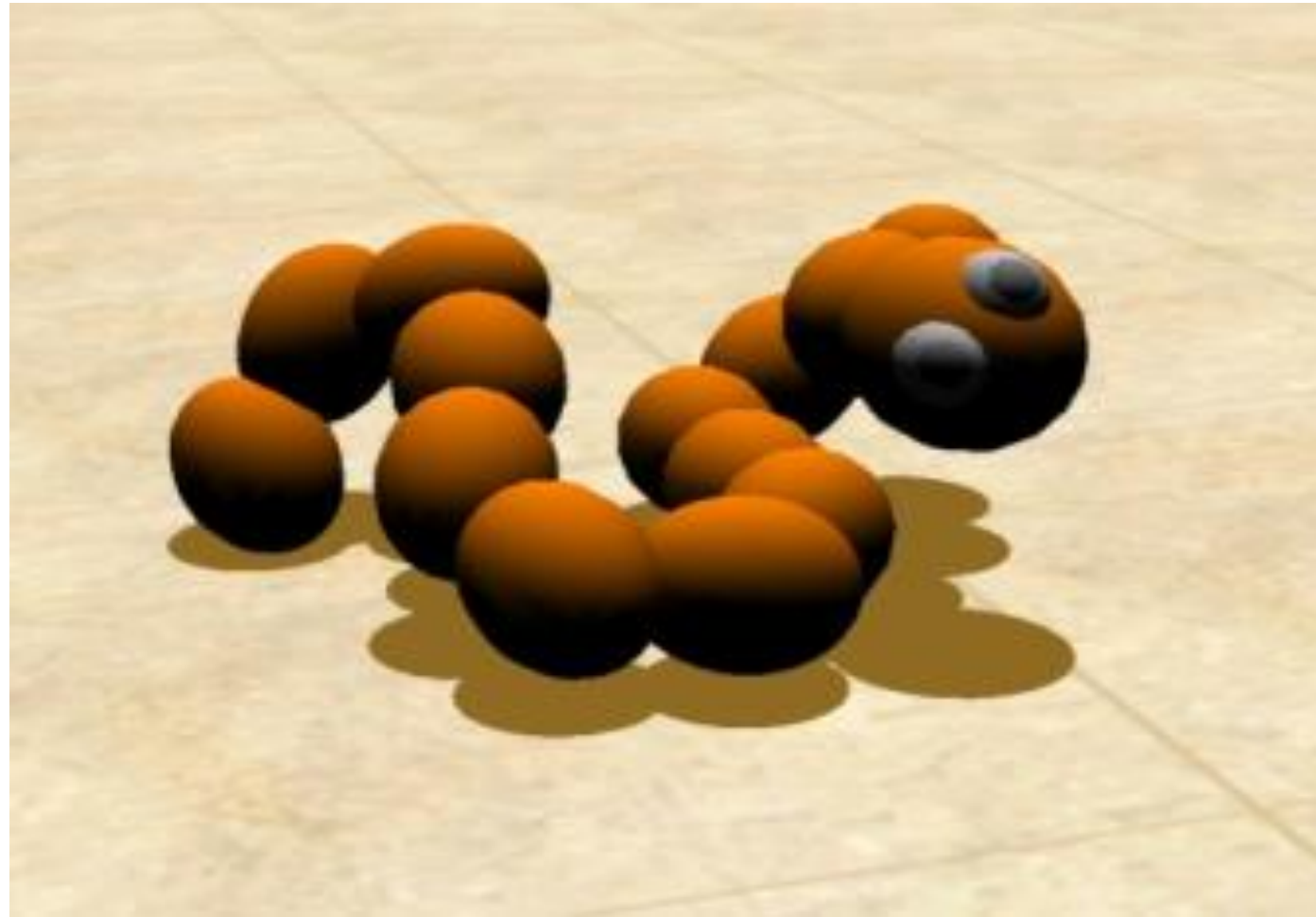
$$\Delta HN + \sum_i^n \Delta H_i - \Delta I \leq I(X; C) \quad (II)$$

Relations (II) links the mutual information between the controlled variable and the controller to the information stored in the elements, the mutual information between them and the information stored in the network and accounts for the redundancies through the multi information term  $\Delta I$ .



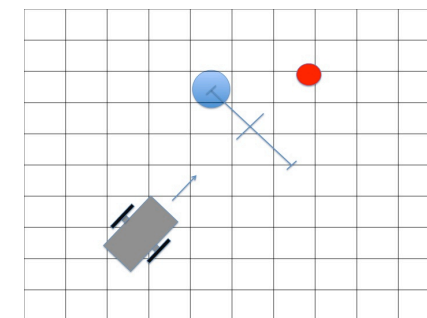
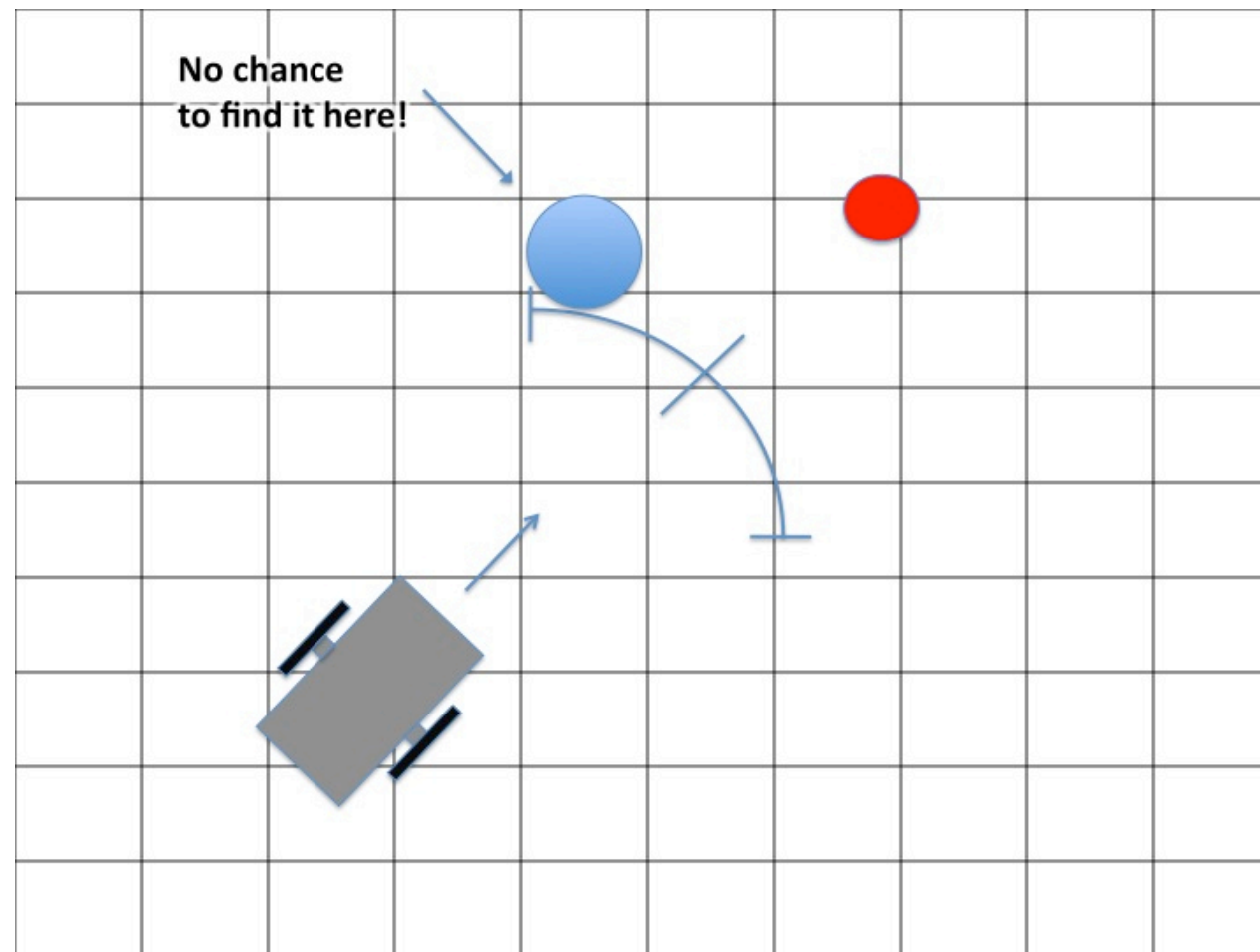
# Snakebot

---



see: Tanev et. al, IEEE TRO, 2005

# Maybe not GOF Euclidean space? :-)



see: **Bonsignorio, Artificial Life, 2013**

# Synthetical methodology

---

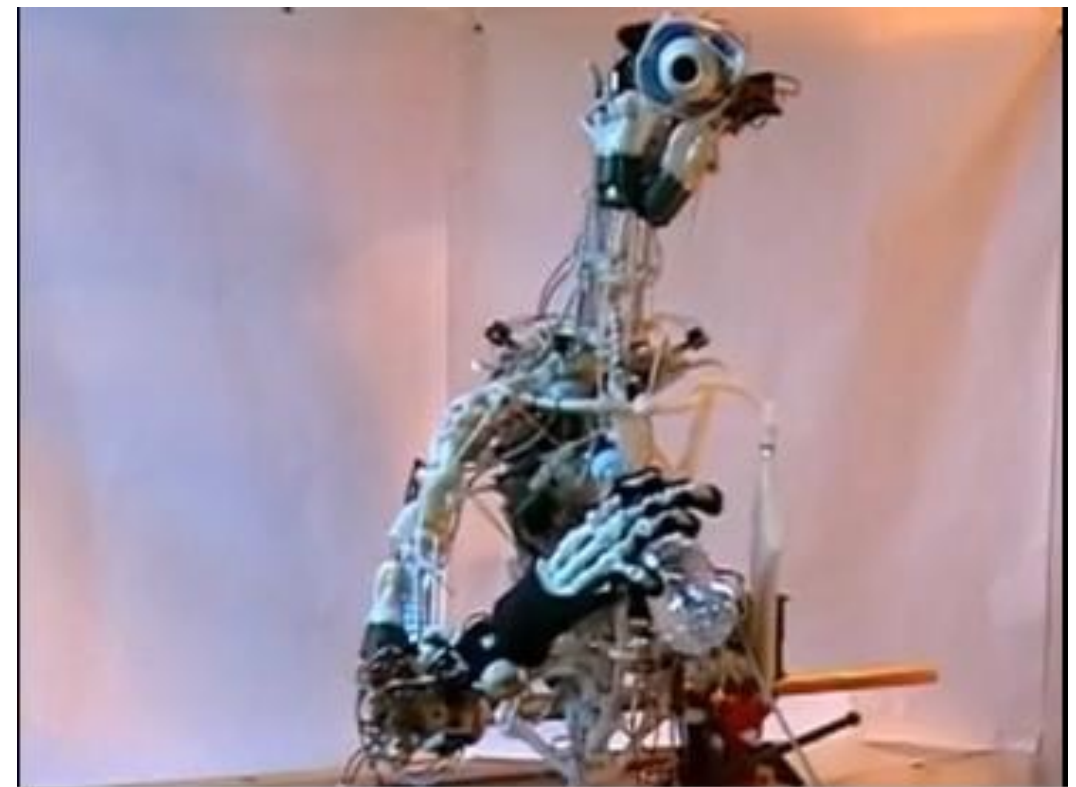
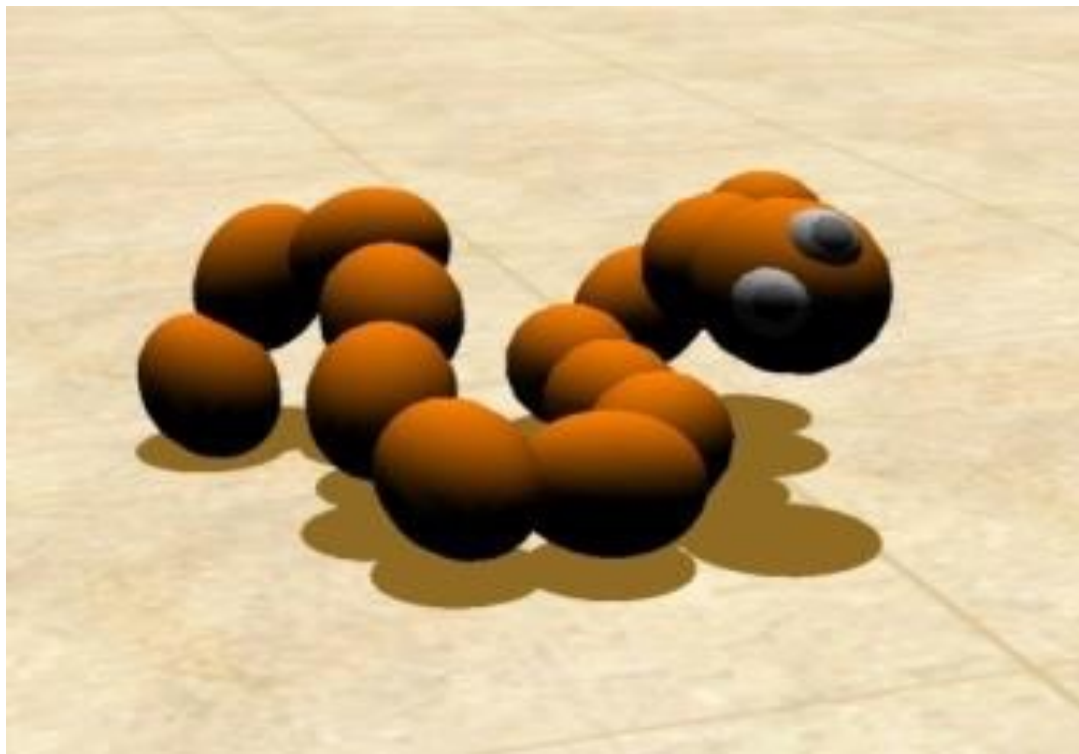
In order to understand (and design)  
the behaviors of this kind of systems...





# Synthetical methodology

We may build, and mathematically model, simpler ones...



and design discriminating experiments...

# Embodied Intelligence or Morphological Computation: the modern view of Artificial Intelligence

## Classical approach

The focus is on the brain and central processing



## Modern approach

The focus is on interaction with the environment. Cognition is emergent from system-environment interaction



# PARADIGM CLASHES

Rolf Pfeifer and Josh C. Bongard, *How the body shapes the way we think a new view of intelligence*, The MIT Press, Cambridge, MA, 2007



# Soft Robotics: a working definition

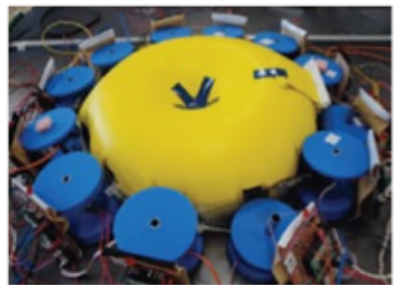
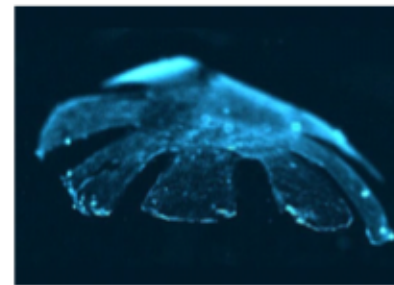
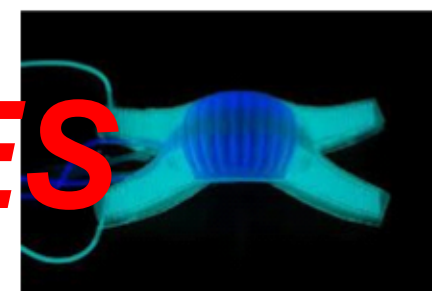
## Variable impedance actuators and stiffness control

- \* Actuators with variable impedance
- \* Compliance/impedance control
- \* Highly flexible (hyper-redundant or continuum) robots

## Use of soft materials in robotics

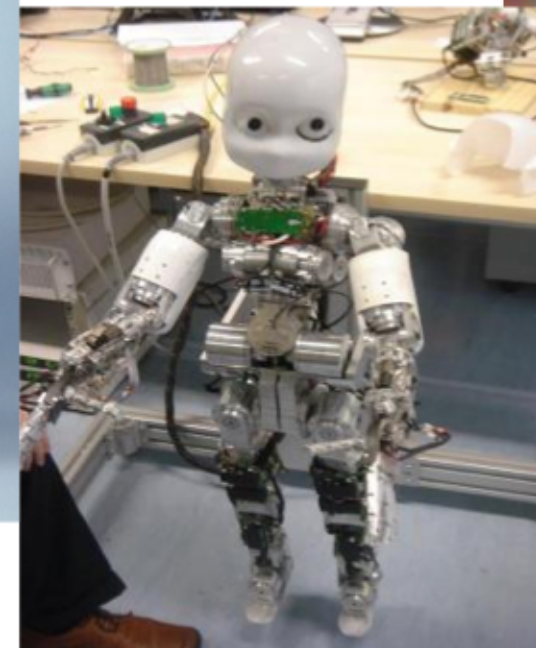
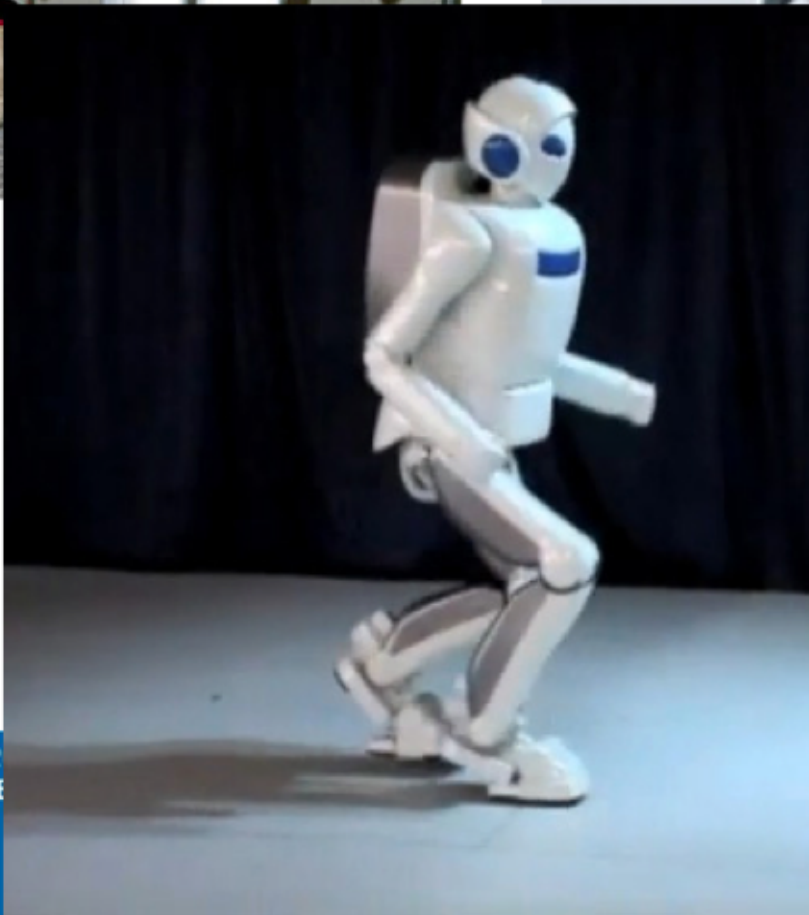
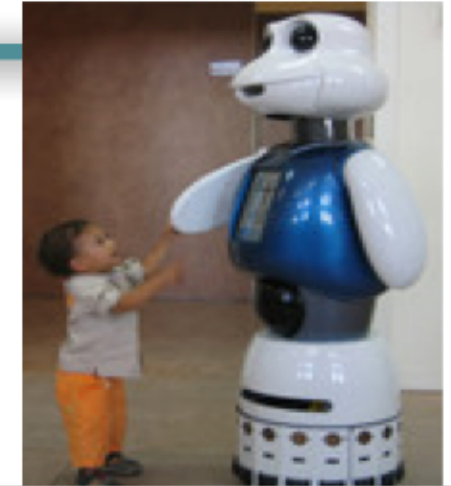
- \* Robots made of soft materials that undergo high deformations in interaction
- \* Soft actuators and soft components
- \* Control partially embedded in the robot morphology and mechanical properties

**PARADIGM CLASHES**

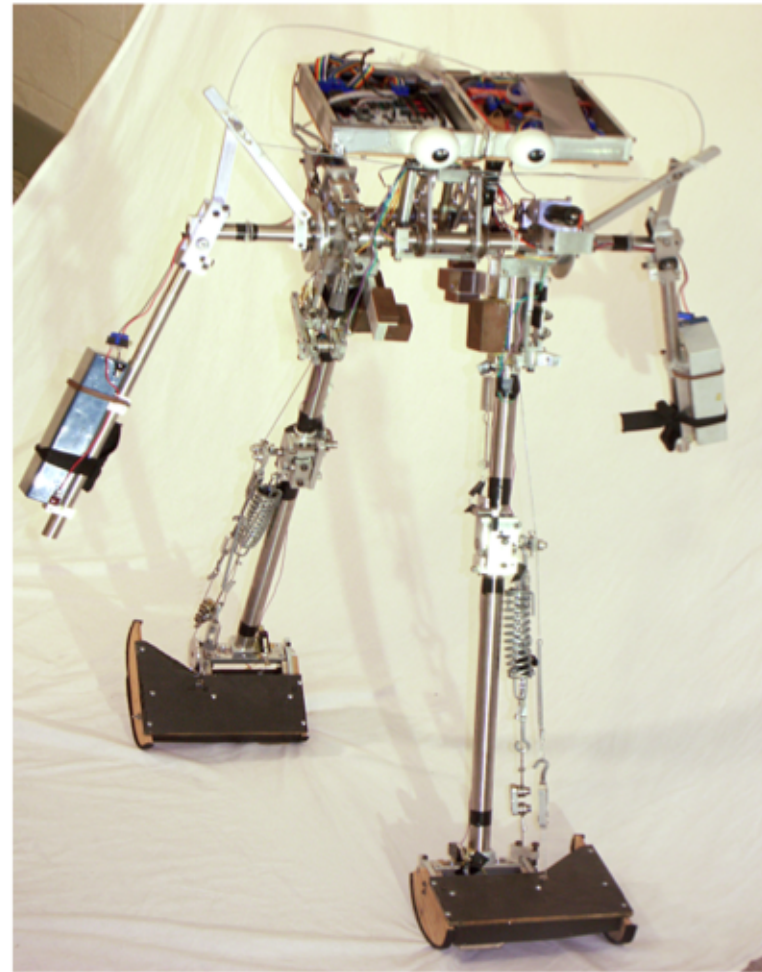




# Today's humanoids



# Conceptually different humanoid designs (mainly research)





# How to build a 'new paradigm' robot like the Cornell Ranger able to wave the hands like NAO? (and manipulate...)

a) Cornell ranger

b) Nao walking down a ramp



# An Inconvenient truth

## Are we running out of time?

- 1) climate change's consequences are not going to be smooth
- 2) world population will peak in the range 9-11 bn around 2030-2040 (depending on the estimates)
- 3) “we would need at least two - eight? - planets to give everyone a decent quality of life” by that time, Is that true? how can we escape the curse?



# Thank you for your attention!

