



### **Morphological Control**

Applied Embodied Intelligence in Mechanical and Biological Systems Offering New Perspectives to Creativity Support Systems

#### KICSS 2015 Phuket, November 13, 2015

Rudolf M. Füchslin Zurich University of Applied Sciences





- Drinking beer: You walk, because your body computes.
- Evolving self assembling computers: Some Dos, some Don't's.
- Chemically embodied intelligence: Much more than robots!
- Evolutionary engineering
- Morphological computation as a tool for creativity

#### **Morphological Control**





## Morphological Control: Exploit the physical dynamics of the system for control purposes.

#### **Embodied Intelligence**

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#### Technical Systems (Robocup 2013)





Pennsylvania Ballet's Valerie Amiss and Jonathon Stilesin the world premiere of Kirk Peterson's "Dancing With Monet (A Gathering at Argentuil)" Photo: Paul Kolnik

#### **Biological Systems**







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#### **MorphComp: Blur hard / software**



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#### Embodiment: Control outsourced to body morphology. In general: BLURR DISTINCTION BETWEEN HARD-AND SOFTWARE





Morphology = Shape + material properties

#### **Conventional Control: Ideal Situation**





the control task.

#### **Conventional Control: Real Situation**





#### Real control: minimize the effects of the morphology.

#### **Morphological Control**

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## Morphological control exploits and optimizes the effects of morphology.

#### **Gait Patterns**

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#### **Gait Patterns**





Mathematics and Physics

- Brain chooses red or green basin of attraction.
- Body-dynamics drives system into attractor (and keeps it there).

#### Gait Patterns: Picture incomplete

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Two Selfstabilizing Gaits



- Transient time should be short.
- Fluctuations: Strong damping
- Attractor landscape can be changed.

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### Morphological Control: Adapting Attractors



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#### Training -> Brains learns posture such that specific movements are optimally supported by morphology





Experienced skiers: Posture is essential for precise reactions on unexpected bumps.

Schack, T., & Ritter, H (2009). .

#### **Obstacle Avoidance: The Insect's Way**





Eye bot



Simple morphology Complex network

Complex morphology Simple network



Lukas Lichtensteiger

#### Aging: Loss of Control over Movements



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## We can't rejuvenate your body. But maybe, we can rejuvenate your attractor landscape!

#### First Steps Towards Support System





Berner Fachhochschule

Mechanical knee-joint simulator with tensairity actuators



Test system for supporting and stabilizing knee dynamics: **Not a servo!** 

A.Dzyakanchuk, Kenneth Hunt, R. Füchslin, R. Luchsinger, M. Muster







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#### Brain & Body: A Result from Robotics



- Feed-forward neural networks have some but not universal computational power.
- Mechanical mass-spring systems can generate time-dependent signals.

Recent result: A properly interfaced hybrid system (mass-spring + feed forward neural network) can emulate/compute large classes of filters (functions onto functions).

Hauser, H.; Ijspeert, A.J.; Füchslin, R.M.; Pfeifer, R., Maass, W.,,**Towards a theoretical foundation for morphological computation with compliant bodies**", Biological Cybernetics, 2011, Volume 105, Numbers 5-6, p 355-370.

Füchslin; R.M., Dzyakanchuk, A.; Flumini, D.; Hauser, H.; Hunt, K.J.; Luchsinger, R.H.; Reller, B.; Scheidegger, S.; Walker, R. "**Morphological Control Applications and Steps Towards a Formal Theory**". Artificial Life 19 9-34.







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#### AILabs's Roboy and other Softies

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#### Industrial robots





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#### **Conventional Control: Real Situation**





Real control: minimize the effects of the morphology.

## Makes robots stiff (localization in real space) and heavy (localization in momentum space).







## Soft Robots Are Safe Robots (and cheap and of low weight and ...)





#### Employing L-systems to Generate Mass-Spring Networks for Morphological Computing

R. Bernhardsgrütter<sup>†</sup>, C. W. Senn<sup>†</sup>, R. M. Füchslin<sup>†</sup>, C. Jaeger<sup>†</sup>, K. Nakajima<sup>‡</sup> and H. Hauser<sup>‡</sup>

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and Complex Dynamical Systems, Graduate School of Informatics, Kyoto University, Kyoto, Japan
‡ Artificial Intelligence Laboratory, University of Zurich, Zurich, Switzerland







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#### **MorphComp: Blur hard / software**

#### Problem: Evolving a 4bit x 4bit Multiplier





Each square represent a logical gate (4 input, one output).

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The gates as well as the wiring is evolvable.

- Tangen Uwe.
- Miller, Julian.

### Problem: Intelligent Learning





Such arrays of logical gates did not show good evolvability.

They never exhibited structure or could generalize results.



## Many problems are solved by a regular arrangement of simple logical components.



X, Y: factors M: Product S: Sum

C: Carry

Rationally designed multplier





## Global logic structure of a problem is transferred into the **geometry of the arrangement** of function generators.

#### Self assembly

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# Scalable patterned structures can be obtained from <u>self-assembling logical blocks</u> (SLB).



## Morphology = geometry

## Recognition sites for self-assembly

R. M. Füchslin, T. Maeke, U. Tangen, and J. S. McCaskill. **Evolving inductive generalization via genetic self-assembly**. Adv. in Compl. Systems 9: 1-29 (2006).





# Self – assembly enables patterned, scalable circuitry.

# New genetic algorithm is needed to enforce it.



Edge blocks

Board

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Board

Each individual carries a construction scheme and a test vector, both evolvable Tournament by mutual exchange of problems

#### 0` 0 digits (bits) 40000 60000 20000 80000 1e+05 generations (updates of a population of 32 individuals) As soon as the circuit masters 4bit x 4bit ("Das kleine

Einmaleins") multiplication, it can be scaled up to arbitrary size  $\rightarrow$  inductive generalization.

Inductive Generalization: 8x8 bit multiplier





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#### Size of Test-Vectors

2e+07 1.5e+07 1e+07 5e+06 4 8 16 32 64Size test vector

32 runs for each testvector size, quartile box plots.

EITHER successful evolution of multiplier OR stop after 16 million generations.

For test vectors of size 4 or 64, more than three quarters of the runs didn't succeed.



#### Structural Subtask

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1101 x 000	0	0110 x 0001	1	1010 x 0100
000	0	0110	)	0000
0000	2.	0000	3.	0100
0000		0000	_	0000
00000	0	0000110	) _	0010000
mult. with zero		mult. with one		mult. with 2^n
4.	1010 x 1001	5.	1001 x 1011	_
	0000		1011	
	1001		0000	
	1001		1011	
	1011010		1100011	-
	carryless addition		full addition	
# Key Point of Test Vectors



- Information is only preserved when regularly tested
- "Learning" the solution of a specific problem is of limited value; it will be forgotten in the drifting population of test problems
- "Understanding" how to handle a whole class of problems can be maintained.





If a circuit "stores" the result of 13\*2, the benefit is temporary, if it implements diagonal shifts for the multiplication with powers of two, a permanent gain results.

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# Is Self-Assembly Versatile?

- multiplier
- ALU
- binary to Gray-code
- Gray-code to binary
- binary in, add, Gray code out









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**Embodied Process Control** 



Embodied Intelligence in Robotics

# **Classical Mechanics**

Embodied Process Management in Chemistry

**Statistical Mechanics** 

# Morphology

Chemistry + supramolecular compounds + membranes + ...







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# **Cells: The Network Picture**

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# Multi – Scale Processes: Endocytosis

Receptor – mediated endocytosis:

- Chemical reactions
- Supramolecular self assembly

Rab4-GDP

Rab4-GTP

AP-1 Arf-GTP <

AP-1\_Arf-GTP\_Clathrin

Budding of the vesicle

membrane

Pi-

GAP

GEF

Arf-GDP

Arf-GTP

GEF

GDP

GDP

Membrane physics

GAP

Rab4-GTP Rabaptin5

cytosol

Dynamin

Rababptin5 41

AP-1 🗲

Clathrin 1

Endophilin

decoating <







### M. Zerial

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H. McBride



# Endocytosis

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Lesson learnt: Molecular pathways have to be complemented by multiscale dynamics.



R. M. Füchslin, T. Maeke, and J. S. McCaskill (2009). *Europ. Phys. J. E: 29:4 p 431-448.* 

Visualization: N. Mennes and T. Maeke

# Two Types of Diseases

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# **Evolutionary Medicine**



### OPINION

# Darwinian medicine: a case for cancer

#### Mel Greaves

Abstract | Epidemiological, genetic and molecular biological studies have collectively provided us with a rich source of data that underpins our current understanding of the aetiology and molecular pathogenesis of cancer. But this perspective focuses on proximate mechanisms, and does not provide an adequate explanation for the prevalence of tumours and cancer in animal species or what seems to be the striking vulnerability of *Homo saptens*. The central precept of Darwinian medicine is that vulnerability to cancer, and other major diseases, arises at least in part as a consequence of the 'design' limitations, compromises and trade-offs that characterize evolutionary processes.

M. Greaves, Nature Reviews Cancer 7, 213 – 221 (2007).

# Mice and Elephants



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# Cells as Dynamical Systems

### OPEN CACCESS Freely available online

### A Dynamical Model of Genetic Networks for Cell Differentiation

M. Villani

### Marco Villani<sup>1,2</sup>, Alessia Barbieri<sup>1</sup>, Roberto Serra<sup>1,2</sup>\*

1 Modelling and Simulation Laboratory, Department of Communications and Economics, University of Modena and Reggio Emilia, Reggio Emilia, Italy, 2 European Centre for Living Technology, Venice, Italy

### Use of abstract random Boolean networks.

R. Serra





March 2011 | Volume 6 | Issue 3 | e17703



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Engineering



# A Puzzle in Radiotherapy





Conundrum: Reaction of cells to irradiation highly nonlinear. "The more intensity, the more (long-term) damage" does not hold (Fig. by S. Scheidegger).

Scheidegger, S.; Füchslin, R.M.; Timm, O.; Eberle, B.; Bodis, S. (2015). **A novel approach for thermal dosimetry**. In: Proc. of the ESHO Annual Meeting 2015. (26). Zurich: European Society for Oncological Hyperthermia.

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# **Embodied Process Control**











# Conditions have to be suitable for all reactions.

Reactions take place in an optimal environment

# **Optimization by Compartmentalization**



- Pro: Compartmentalization 
   Optimization by branch-specific choice of chemical conditions.
- Con: Matter and information has to be transported between the compartments.



# Programming by Arranging



- Matter and signal transport takes place between adjacent containers.
- The arrangement influences the overall reaction.



# Optimization by Control by influencing compartmentalization matter transport

# **Artificial Branched Molecules**

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# Synthetizing Branched Molecules in silico







- Each type of container performs a specific synthesis step.
- Containers arranged by stochastic self-assembly.

Benedikt Reller, R. Füchslin (MATCHIT)



# **MATCHIT** Automaton





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D. Lancet, S. Rasmmussen



- 1 dim channel
- So called chemtainers (e.g. vesicles) interact with channel and each other.
- Control by DNA computing

Weyland, M. S.; Fellermann, H.; Hadorn, M.; Sorek, D.; Lancet, D.; Rasmussen, S.; Füchslin, R.M. (2013). The MATCHIT Automaton: Exploiting **Compartmentalization for the Synthesis of Branched Polymers. Computational** and Mathematical Methods in Medicine, 2013, Article ID 467428.

J. McCaskill



Mathias Weyland

**Evolution vs. Compilation** 

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# Golgi Apparatus





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### Production of oligosaccharides (among other things)







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# Rational and Evolutionary Design



- Humans tend to design in a modular manner: The resulting structures are comprehensible. This comprehensibility supports rational planning and usage.
- Nature has no rational; solution only need to be effective but don't need to be comprehensible.
- Evolution can only perform optimizations which immediately yield a benefit, but not follow e.g. "platform strategy" which deliberately facilitates future extensions.
   The evolutionary approach yields efficient and yet robust solutions



Living technology aims at developing and exploiting the combination of both approaches: The structural unboundedness of evolution with the potential of human foresight. Living Technology does not only transfer the means of nature in an artificial and designed context but also tries to learn from nature's ways (organization and process control).







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# Understanding Life?

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**Analyzing Evolved Structures** 



If one analyzes biological systems always observe:

- Genotype encodes the physiology and is subject to variation / inheritance.
- Phenotype is the subject of selection.

# Genotype ←→ Syntax Phenotype ←→ Semantics

# Analyzing Evolved Structures



If you want to understand an evolved system, consider:

- You will not understand a program such as Powerpoint by analyzing the dynamics of the bits and bytes in your laptop.
- You will not understand the content of a book by counting the frequency of individual letters in a text.

Analyzing evolved systems requires to find level of semantics, not the one of syntax! Your Partner University in Switzerland



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# European Centre for Living Technology





# Research

- Living Technology
- Applied Statistics
- Complex Systems
- Social Sciences
- Environmental research









- Morpho computational power of body may be restored by mechanical means.
- The dynamic systems perspective opens a new look on cell dynamics.
- Logic can be transferred into geometry and self assembly can support induction.
- Spatially structured reaction environments: Synthetizing branched polymers.
- Morphological control offers a non enumerative mechanism for protecting replication systems.
- From an engineering perspective, a coupling between nervous and immune system is plausible.

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# THANKS for your **Attention!**

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# Abstract



Present computer science distinguishes sharply between hard- and software. Stripping off all physics from the abstract concept of computation yields such wonderful results as higher – level languages, abstraction and portability. However, there is a price to pay: Controlling physical processes, e.g. a robot, requires bringing back physics via a lot of coding. Additionally, distinguishing hard- and software may facilitate the work of human engineers and programmers but seems to be less relevant in control systems resulting from an evolutionary process.

This talk presents the concept of morphological control. The physical dynamics of a computing system are not anymore regarded as something that, in the best case, doesn't disturb a computation but is an essential part of it. In short, morphological control exploits physical dynamics for control purposes. This approach requires a close collaboration between experts from computer science, dynamical systems theory, control theory and machine learning. Morphological control offers new perspectives to Creativity Support Systems by presenting a control paradigm that is intended to be closer to biological systems. Biomimetic technology aims at exploiting the ways and means of nature for the purpose of optimizing engineered systems. Whereas most bionics focusses on the means (materials), the focus in morphological control is put on the ways (organizational principles) and to learn how nature's evolved process management can be used in rationally planned engineering.

Most often, morphological control is illustrated by and used for applications in robotics. Our interpretation broadens the concept and includes also systems that are governed statistical mechanics. This means that also cellular dynamics can be understood from the perspective of morphological control. With respect to applications, this talk also includes instances of morphological control in biology and medicine and analyses them from a practical as well as theoretical perspective.nt computer science distinguishes sharply between hard- and software.

# Artificial (& natural?) Immune Systems



# Question (Roland Scholz, ETHZ): Is there a non – enumerative way to detect non - default states in the states of tissues?


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Polly Matzinger: The Danger Model: A Renewed Sense of Self, Science 296, 301 (2002)

## to discriminate between the self and the non - self. P. Matzinger developed an alternative view: The immune

system is activated by general signs of danger, not (only) by foreignness.

Classical view (simplified): The adaptive immune system learn

- Among other things, the model explains
  - Why the immune system can respond to tumors
  - Why one needs adjuvents to make vaccines effective.







## Detecting Danger by Morphology



- Fact: Chain molecules may fold up and get a non trivial morphology.
- Fact: This fold is determined by
  - the molecules sequence (proteins: amino acids)
  - the conditions under which the fold takes place.

## **Detecting Danger by Morphology**

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### **Cell with subnetwork**



Assume a molecule M with a fold that is evolved to be highly susceptible to chemical conditions



**Default fold** 

"Something is wrong" fold Epitope D activates IS



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- Morphology of the molecule is sort of a "checksum".
- We don't claim that the mechanism is present in biological systems, but it may be implemented in artificial evolvable replication systems.



S. Altmeyer, R. M. Füchslin, J. S. McCaskill, "Folding stabilizes the evolution of catalysts", Artificial Life 10 (1): 23-38 (2004). R. M. Füchslin, S. Altmeyer, J.S. McCaskill, "Evolutionary stabilization of generous replicases by complex formation", Europ. Phys J. B 38 (1): 103-110 (2004).

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## Neuroimmunology



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# The chemical immune systems know that and what is going wrong

## The nervous system knows where it is going wrong





- Nervous and immune system are coupled.
- Rolf Pfeifer: Find the optimal balance between nervous system and morphological control



### **Counterargument: Depression**



- There is only limited evidence for an influence of the psyche on the immune system.
- BUT: Mental processes have, if at all, only indirect influence on chemical processing.

