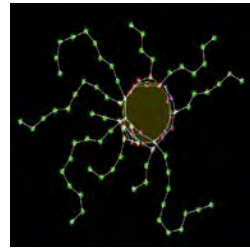


*Morphogenetic Engineering:*

**Biological Development**  
as a new model of  
**Programmed Self-Organization**



*René Doursat*

*CNRS – Complex Systems Institute, Paris – Ecole Polytechnique*



INSTITUT  
DES **SYSTEMES** COMPLEXES



## Special theme: Unconventional Computing Paradigms

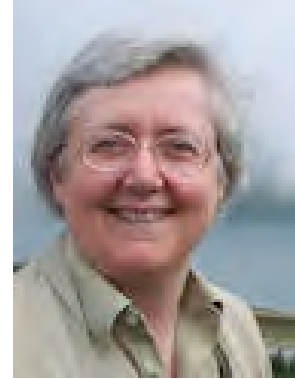
### Also in this issue:

**Keynote**  
Unconventional Computation  
by Susan Stepney

**Research and Innovation**  
Self-Organizing P2P Systems  
Inspired by Ant Colonies  
by Carlo Mastroianni

Simulation and Assessment of  
Vehicle Control Network Systems  
by Alexander Hanzlik and Erwin  
Kristen

## Susan Stepney, York



- Stanislaw Ulam [said] that using a term like nonlinear science is like referring to the bulk of **zoology** as the study of **non-elephant** animals.
- The elephant in the room here is the classical Turing machine. **Unconventional computation** is a similar term: the study of non-Turing computation.
- The classical Turing machine was developed as an **abstraction** of how human “computers”, clerks following predefined and prescriptive rules, calculated various mathematical tables.
- **Unconventional computation can be inspired by the whole of wider nature.** We can look to **physics** (...), to **chemistry** (reaction-diffusion systems, complex chemical reactions, DNA binding), and to **biology** (bacteria, flocks, social insects, evolution, growth and self-assembly, immune systems, neural systems), to mention just a few.
- **PARALLELISM – INTERACTION – NATURE**

→ **COMPLEX SYSTEMS**

# COMPLEX SYSTEMS & COMPUTATION

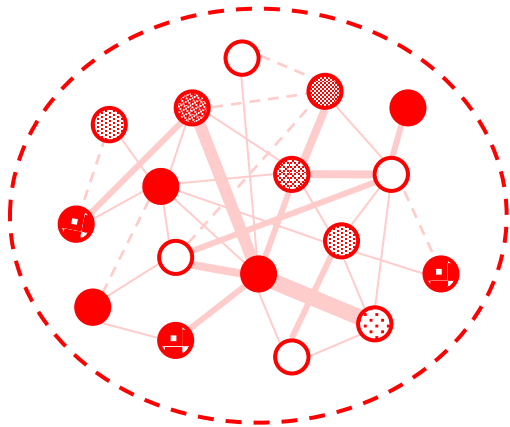
## 1. What are Complex Systems?

- Decentralization
- Emergence
- Self-organization



# 1. What are Complex Systems?

➤ Complex systems can be found everywhere around us

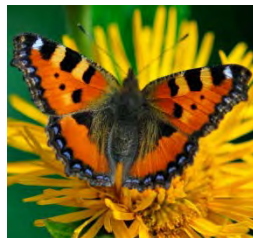


- a) **decentralization**: the system is made of myriads of "simple" agents (local information, local rules, local interactions)
- b) **emergence**: function is a bottom-up collective effect of the agents (asynchrony, homeostasis, combinatorial creativity)
- c) **self-organization**: the system operates and changes on its OWN (autonomy, robustness, adaptation)

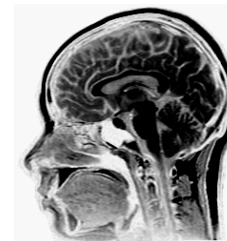
➤ **Physical**, **biological**, **technological**, **social** complex systems



pattern  
formation  
○ = matter



biological  
development  
○ = cell

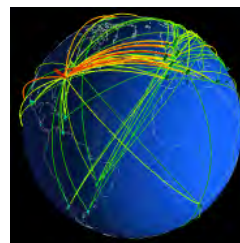


the brain  
& cognition  
○ = neuron

insect  
colonies  
○ = ant



Internet  
& Web  
○ = host/page



social  
networks  
○ = person



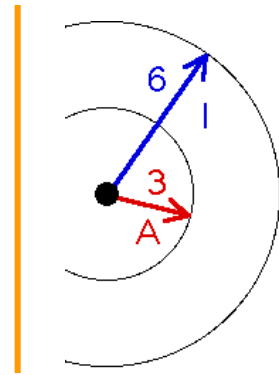
# 1. What are Complex Systems?

## ➤ Ex: Pattern formation – Animal colors

- ✓ animal patterns caused by pigment cells that try to copy their nearest neighbors but differentiate from farther cells



*Mammal fur, seashells, and insect wings*  
(Scott Camazine, <http://www.scottcamazine.com>)



*NetLogo Fur simulation*

## ➤ Ex: Swarm intelligence – Insect colonies

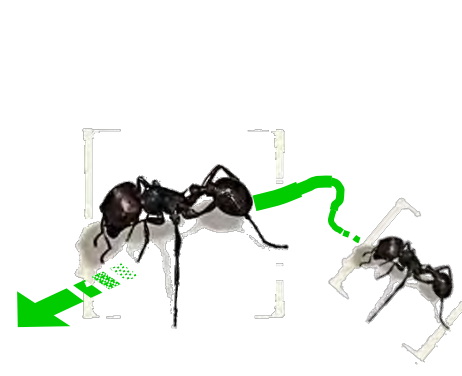
- ✓ trails form by ants that follow and reinforce each other's pheromone path



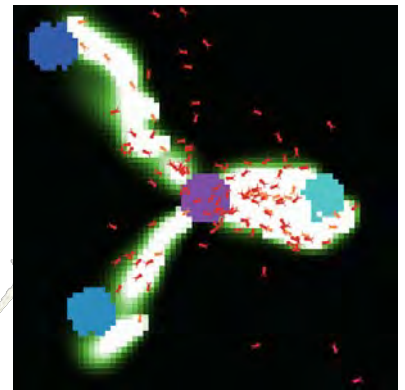
[http://taos-telecommunity.org/epow/epow-archive/archive\\_2003/EPOW-030811\\_files/matabele\\_ants.jpg](http://taos-telecommunity.org/epow/epow-archive/archive_2003/EPOW-030811_files/matabele_ants.jpg)



<http://picasaweb.google.com/tridentoriginal/Ghana>



*Harvester ants*  
(Deborah Gordon, Stanford University)



*NetLogo Ants simulation*



# 1. What are Complex Systems?

## ➤ Ex: Collective motion – Flocking, schooling, herding



**Fish school**

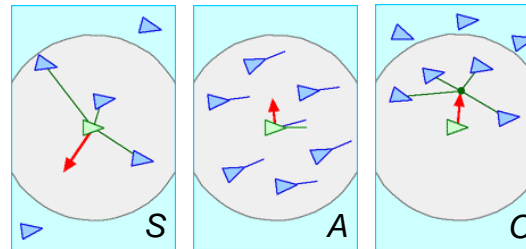
(Eric T. Schultz, University of Connecticut)



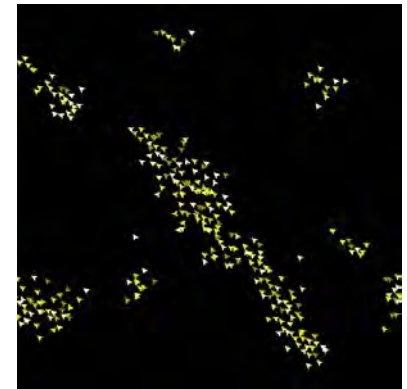
**Bison herd**

(Montana State University, Bozeman)

- ✓ thousands of animals that adjust their position, orientation and speed wrt to their nearest neighbors



**Separation, alignment and cohesion**  
(“Boids” model, Craig Reynolds)



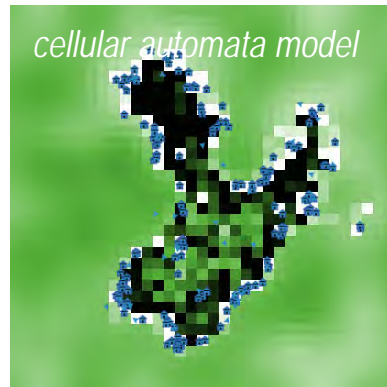
**NetLogo Flocking simulation**

## ➤ Ex: Diffusion and networks – Cities and social links

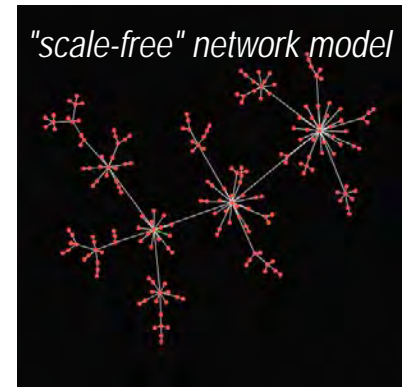
- ✓ clusters and cliques of homes/people that aggregate in geographical or social space



[http://en.wikipedia.org/wiki/Urban\\_sprawl](http://en.wikipedia.org/wiki/Urban_sprawl)



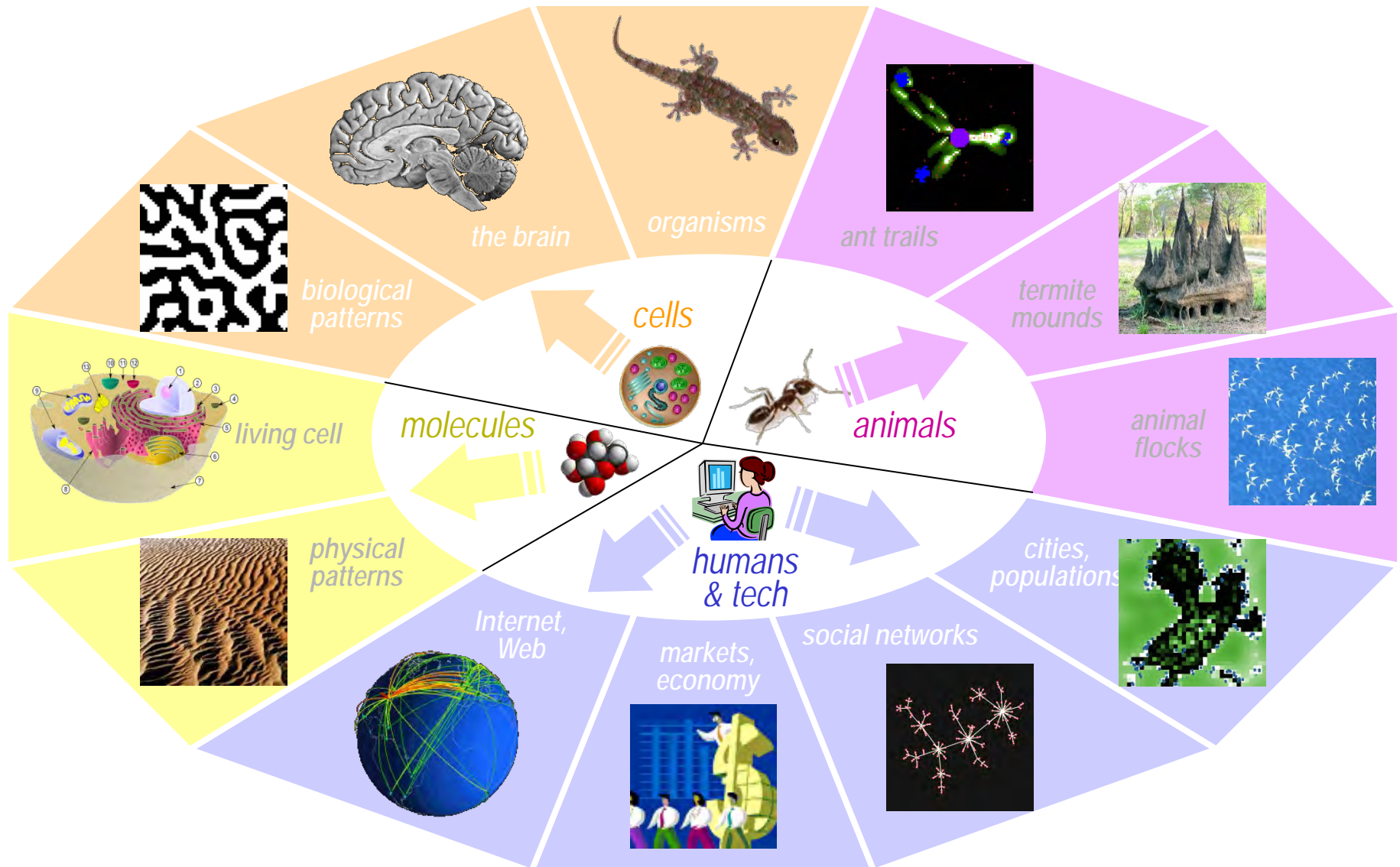
**NetLogo urban sprawl simulation**



**NetLogo preferential attachment**

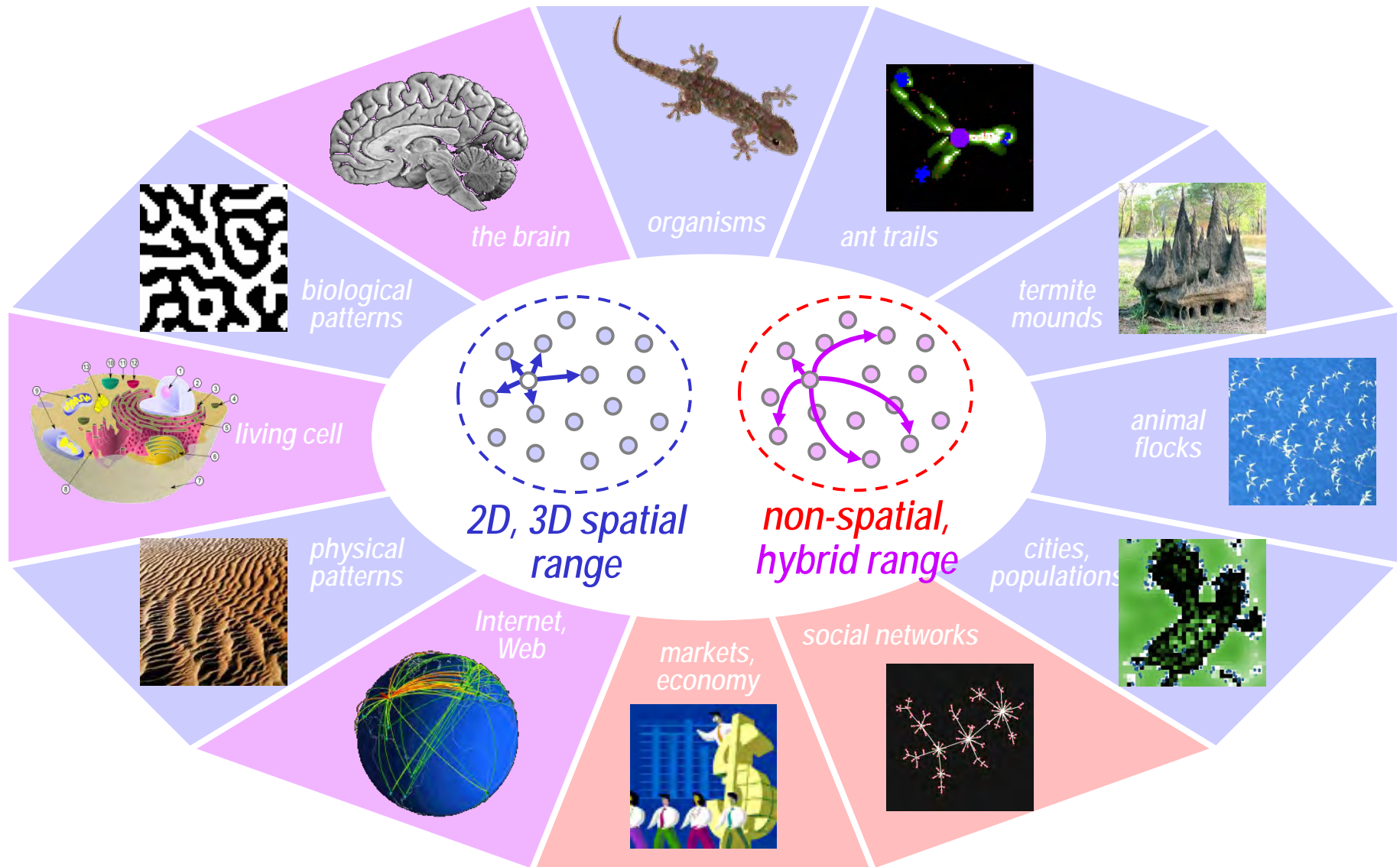
# 1. What are Complex Systems?

*All kinds of agents: molecules, cells, animals, humans & technology*



# 1. What are Complex Systems?

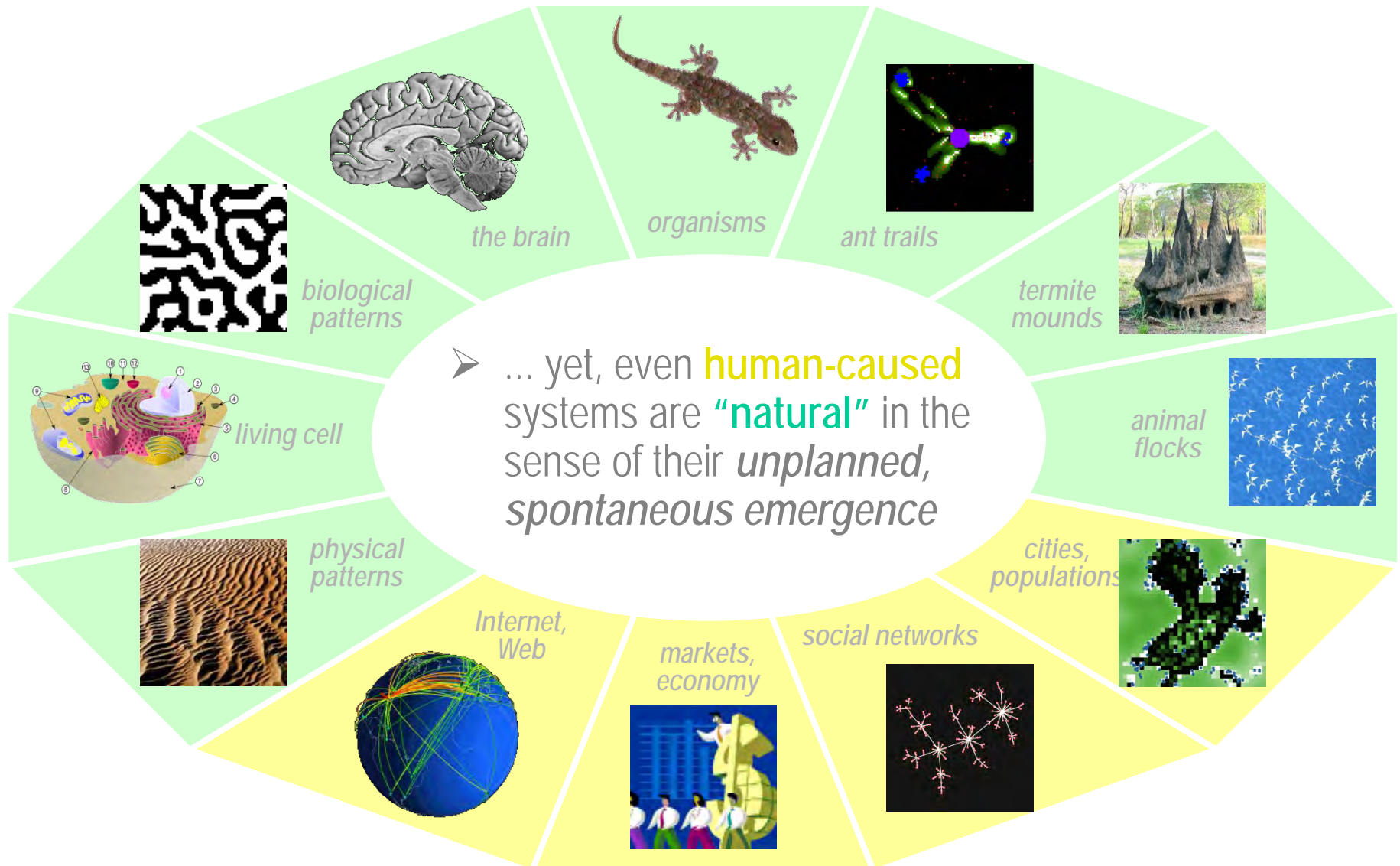
## Categories of complex systems by range of interactions





# 1. What are Complex Systems?

*Natural and human-caused categories of complex systems*



# 1. What are Complex Systems?

*A vast archipelago of precursor and neighboring disciplines*

**complexity:** measuring the length to describe, time to build, or resources to run, a system

- information theory (Shannon; entropy)
- computational complexity (P, NP)
- cellular automata

**adaptation:** change in typical functional regime of a system

- evolutionary methods
- genetic algorithms
- machine learning

→ *Toward a unified "complex systems" science and engineering?*

**systems sciences:** holistic (non-reductionist) view on interacting parts

- systems theory (von Bertalanffy)
- systems engineering (design)
- cybernetics (Wiener; goals & feedback)
- control theory (negative feedback)

**dynamics:** behavior and activity of a system over time

- nonlinear dynamics & chaos
- stochastic processes
- systems dynamics (macro variables)

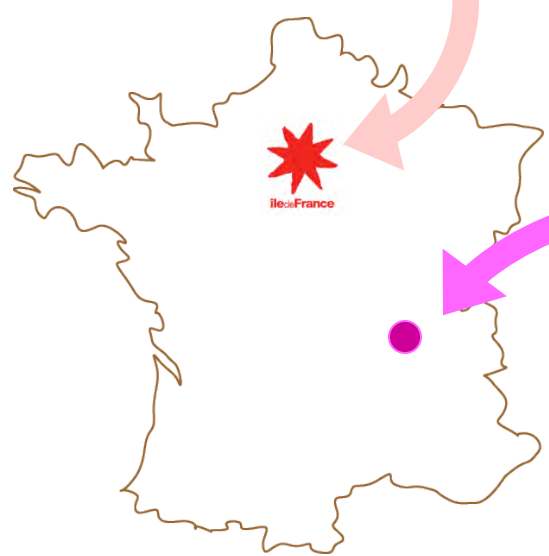
**multitude, statistics:** large-scale properties of systems

- graph theory & networks
- statistical physics
- agent-based modeling
- distributed AI systems

# 1. What are Complex Systems?



**INSTITUT  
DES SYSTEMES COMPLEXES**  
**Paris Ile-de-France**



4<sup>th</sup> French Complex Systems  
Summer School, 2010







**Pierre Baudot**

*Information Theory - Adaptation - Topology - Thermodynamics of perception.*

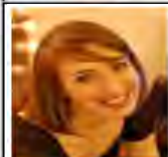
mathematical neuroscience



**René Doursat**

*Artificial development (self-assembly, pattern formation, spatial computing, evolutionary computation) - Mesoscopic neurodynamics (segmentation, schematization, categorization, perception, cognitive linguistics).*

artificial life / neural computing



**Marie-Noëlle Comin**

*Urban systems, networks of cities, innovation, Europe, EU's Framework Programme for Research and Technological Development, converging technologies, NBIC (nanotechnology, biotechnology, information technology and cognitive science).*

urban systems / innovation networks



**Francesco Ginelli**

*Nonequilibrium statistical mechanics ( Active matter, collective motion, flocking, nonequilibrium wetting, directed percolation, long range interactions) - Dynamical system theory ( Lyapunov exponents, Lyapunov vectors, synchronization, stable chaos, spatiotemporal chaos, structural stability, hyperbolicity).*

statistical mechanics / collective motion



**Ivan Junier**

*Bio-related: Genetic regulation - Cellular organization - DNA/chromatin modeling - omics (Genomics, Transcriptomics, proteomics,...) - Condensed matter theory - Inference problems in statistical physics - Network analysis (topology, geometry) - Dynamical behaviors of complex systems. Statistical physics: Out-of equilibrium systems Thermodynamic description of small systems*

structural genomics



**Taras Kowaliw**

*Evolutionary computation, artificial development, computer vision, visualization and electronic art.*

computational evolution / development



**Telmo Menezes**

*Complex network analysis and simulation - Social networks - Evolutionary search for multi-agent models, Genetic programming applied to programmable networks - Bio-Inspired algorithms.*

social networks



**Bivas Mitra**

*Peer-to-Peer networks, Blog networks, Complex networks, Statistical mechanics, Networks modeling, Optical networks, Wireless Internet.*

peer-to-peer networks



**Romain Reuillon**

*High performance computing - Grid computing - Scientific workflows - Model exploration - Distributed stochastic simulations - Parallel pseudo-random number generation - Coffee maker.*

high performance computing



**Jean-Baptiste Rouquier**

*Complex networks: communities, structure, dynamics. Links between fields. Large datasets. Cellular automata: model of complex systems, perturbation, asynchronism, robustness.*

complex networks / cellular automata



**Camilo Melani**

*Grid Computing, Bioemergences Platform (workflow), Morphodynamics reconstruction, Images processing algorithms.*

embryogenesis



**David Chavalarias**

*Web mining and Quantitative Epistemology - Cognitive economics and modelling of cultural dynamics - Collective discovery and scientific discovery.*

web mining / social intelligence



**Srdjan Ostojic**

*Neuroscience théoriques - Spiking Neurons - Dynamiques Stochastiques.*

spiking neural dynamics



**Andrea Perna**

*Morphogenesis, Collective behavior, Spatial patterns, Spatial networks.*

spatial networks / swarm intelligence



**Fernando Peruani**

*Biophysique - Active Matter - Complex Networks.*

active matter / complex networks



**Francesco d'Ovidio**

*Applied nonlinear dynamics - Transport and mixing in geophysical flows - Interaction of physical and ecological processes in the ocean.*

nonlinear dynamics / oceanography

# COMPLEX SYSTEMS & COMPUTATION

## 1. What are Complex Systems?

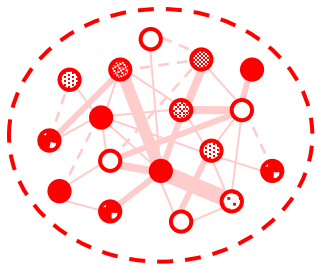
- Decentralization
- Emergence
- Self-organization

## 5. A New World of CS Computation

Or how to exploit and  
organize spontaneity

# 5. A New World of Complex Systems Computation

## ➤ Between natural and engineered emergence

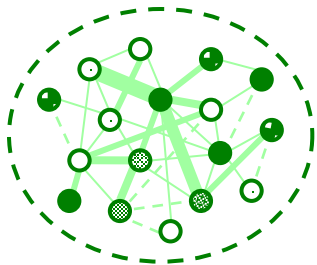


**CS science:** observing and understanding "natural", spontaneous emergence (including human-caused)  
→ *Agent-Based Modeling (ABM)*

But CS computation is not without paradoxes:

- Can we plan autonomy?
- Can we control decentralization?
- Can we program adaptation?

**CS computation:** fostering and guiding complex systems at the level of their elements



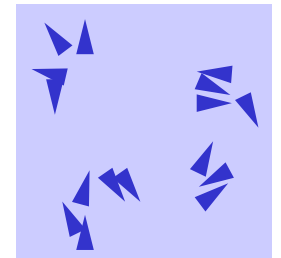
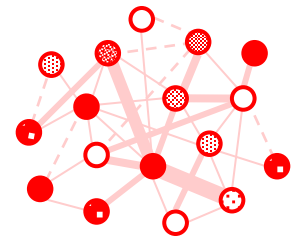
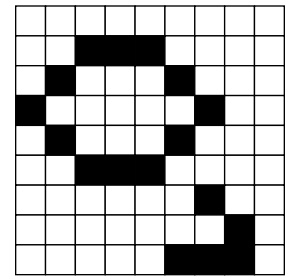
**CS engineering:** creating and programming a new "artificial" emergence  
→ *Multi-Agent Systems (MAS)*



# 5. A New World of Complex Systems Computation

## ➤ Nature: the ABM scientific perspective of social/bio sciences

- ✓ *agent-* (or individual-) *based modeling* (ABM) arose from the need to model systems that were too complex for analytical descriptions
- ✓ main origin: cellular automata (CA)
  - von Neumann self-replicating machines → Ulam's "paper" abstraction into CAs → Conway's *Game of Life*
  - based on *grid* topology
- ✓ other origins rooted in economics and social sciences
  - related to "methodological individualism"
  - mostly based on grid and *network* topologies
- ✓ later: extended to ecology, biology and physics
  - based on grid, network and 2D/3D *Euclidean* topologies

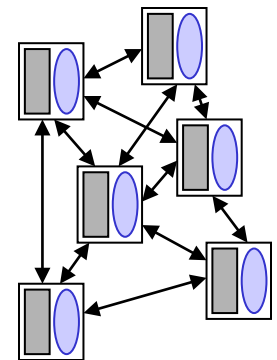
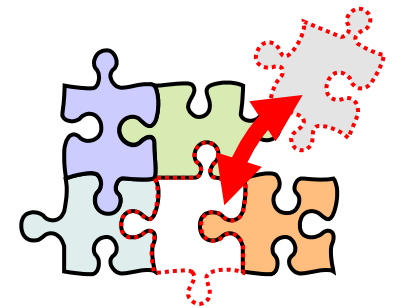


→ *the rise of fast computing made ABM a practical tool*

# 5. A New World of Complex Systems Computation

## ➤ ICT: the MAS engineering perspective of computer science

- ✓ in software engineering, the need for clean *architectures*
  - historical trend: breaking up big monolithic code into *layers*, *modules* or *objects* that communicate via application programming *interfaces* (APIs)
  - this allows fixing, upgrading, or replacing parts without disturbing the rest
- ✓ in AI, the need for *distribution* (formerly "DAI")
  - break up big systems into smaller units creating a decentralized computation: *software/intelligent agents*
- ✓ difference with object-oriented programming:
  - agents are "proactive" / autonomously threaded
- ✓ difference with distributed (operating) systems:
  - agents don't appear transparently as one coherent system



→ *the rise of pervasive networking made distributed systems both a necessity and a practical technology*

# 5. A New World of Complex Systems Computation

- **ICT: the MAS engineering perspective of computer science**
  - ✓ emphasis on software agent as a *proxy* representing human users and their interests; users state their prefs, agents try to satisfy them
    - ex: internet agents searching information
    - ex: electronic broker agents competing / cooperating to reach an agreement
    - ex: automation agents controlling and monitoring devices
  - ✓ main tasks of MAS programming: agent design and society design
    - an agent can be  $\pm$  reactive, proactive, deliberative, social
    - an agent is caught between (a) its own (sophisticated) goals and (b) the constraints from the environment and exchanges with the other agents

→ *CS computation should blend both MAS and ABM philosophies*

- MAS: a few "heavy-weight" (big program), "selfish", intelligent agents  
ABM: many "light-weight" (few rules), highly "social", "simple" agents
- MAS: focus on game theoretic gains  
ABM: focus on collective emergent behavior



# 5. A New World of Complex Systems Computation

- Exporting models of natural complex systems to ICT
  - ✓ already a tradition, mostly in offline search and optimization

*ex: neurons & brain*

*ex: ant colonies*

*ex: genes & evolution*

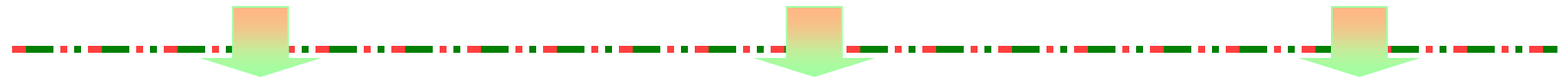
**ABM**



*biological neural models*

*trail formation, swarming*

*laws of genetics*



*binary neuron,  
linear synapse*

*agents that move, deposit  
& follow "pheromone"*

*genetic program,  
binary code, mutation*

**MAS**



*artificial neural networks  
(ANNs) applied to machine  
learning & classification*

*ant colony optimization (ACO)  
applied to graph theoretic  
& networking problems*

*genetic algorithms (GAs),  
evolutionary computation  
for search & optimization*

**TODAY: simulated in a Turing machine / von Neumann architecture**

# 5. A New World of Complex Systems Computation

- Exporting natural complex systems to ICT
  - ✓ ... looping back onto unconventional physical implementation

DNA computing

chemical, wave-based  
computing

synthetic biology

artificial neural networks  
(ANNs) applied to machine  
learning & classification

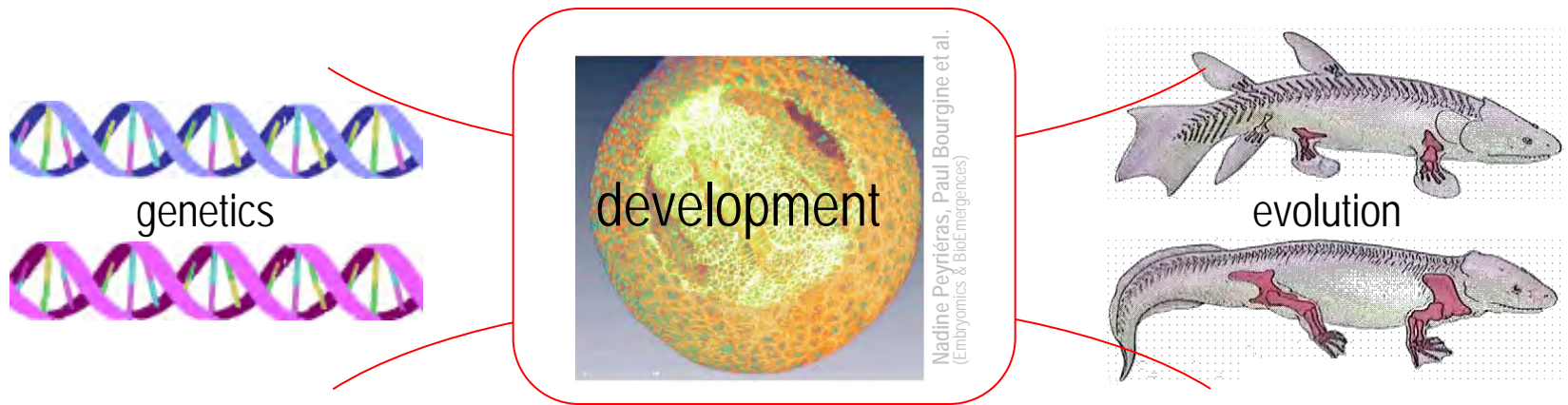
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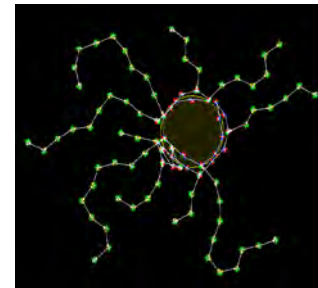
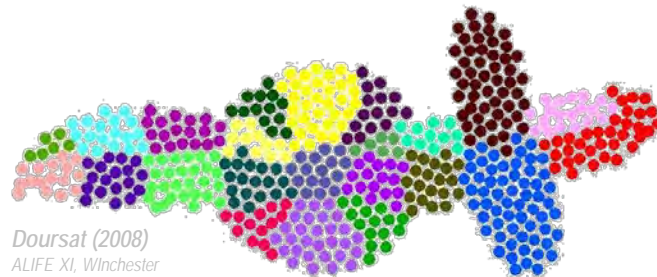
**TOMORROW: implemented in bioware, nanoware, etc.**

# 5. A New World of Complex Systems Computation

- A new line of bio-inspiration: biological morphogenesis
  - ✓ designing multi-agent models for decentralized systems engineering



## Morphogenetic Engineering



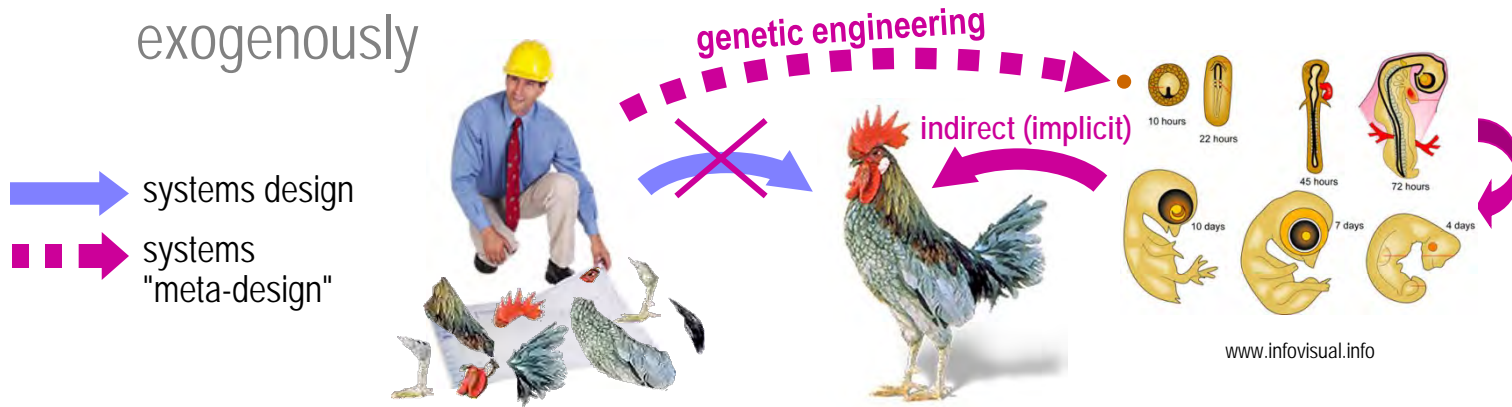
whether Turing machine...

... or bioware, nanoware, etc.

# 5. A New World of Complex Systems Computation

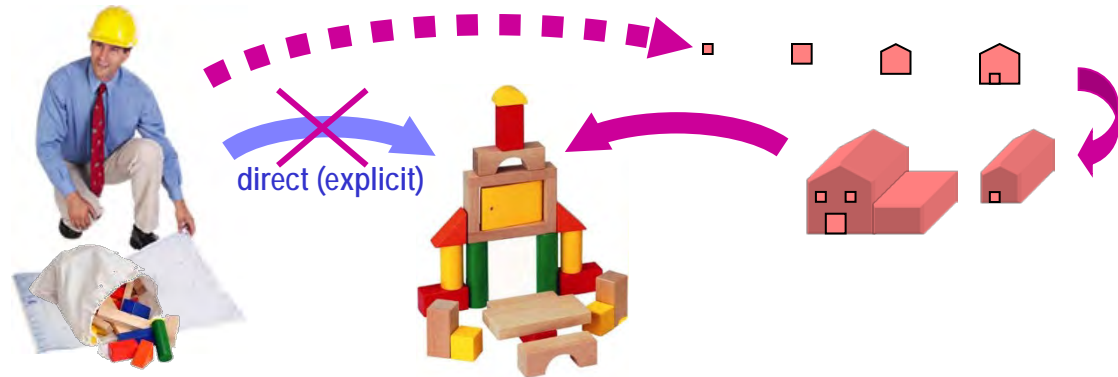
## ➤ ME and other emerging ICT fields are all proponents of the shift from design to "meta-design"

- ✓ fact: organisms endogenously *grow* but artificial systems *are built* exogenously



- ✓ challenge: can architects "step back" from their creation and only *set the generic conditions* for systems to self-assemble?

*instead of building the system from the top ("phenotype"),  
program the components from the bottom ("genotype")*





# 5. A New World of Complex Systems Computation

## ➤ Getting ready to organize spontaneity

### a) Construe systems as self-organizing building-block games

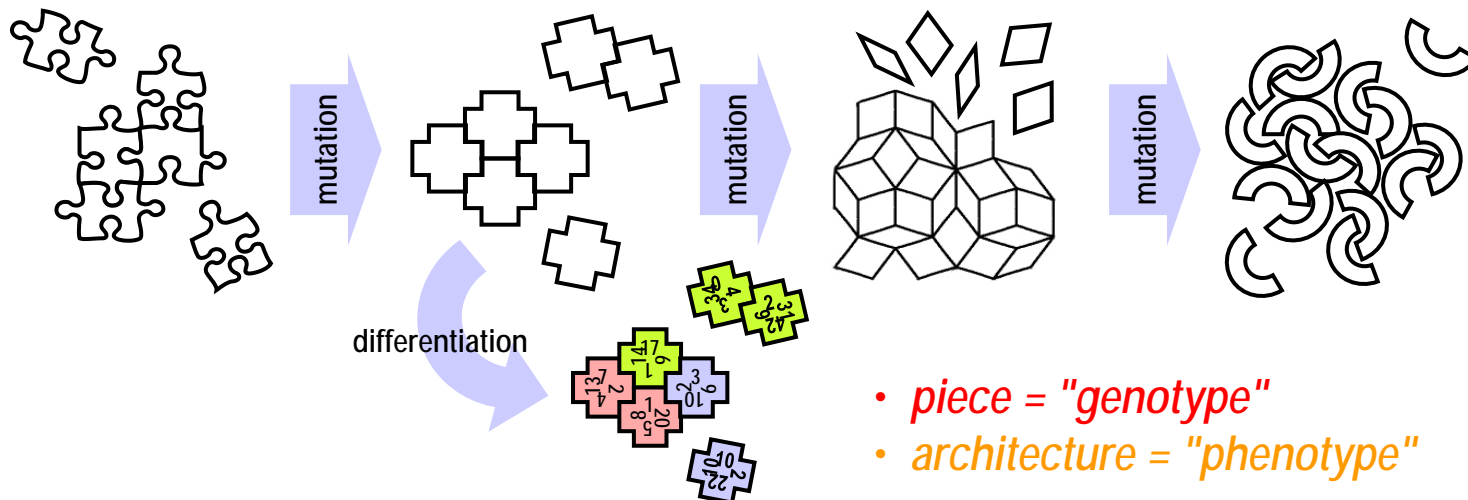
- ✓ Instead of assembling a construction yourself, shape its building blocks in a way that they self-assemble for you—and come up with new solutions

### b) Design and program the pieces

- ✓ their potential to search, connect to, interact with each other, and react to their environment

### c) Add evolution

- ✓ by variation (mutation) of the pieces' program and selection of the emerging architecture



# COMPLEX SYSTEMS & COMPUTATION

## 1. What are Complex Systems?

- Decentralization
- Emergence
- Self-organization

*Complex systems seem so different from architected systems, and yet...*

## 2. Architects Overtaken by their Architecture

Designed systems that became suddenly complex

## 3. Architecture Without Architects

Self-organized systems that look like they were designed

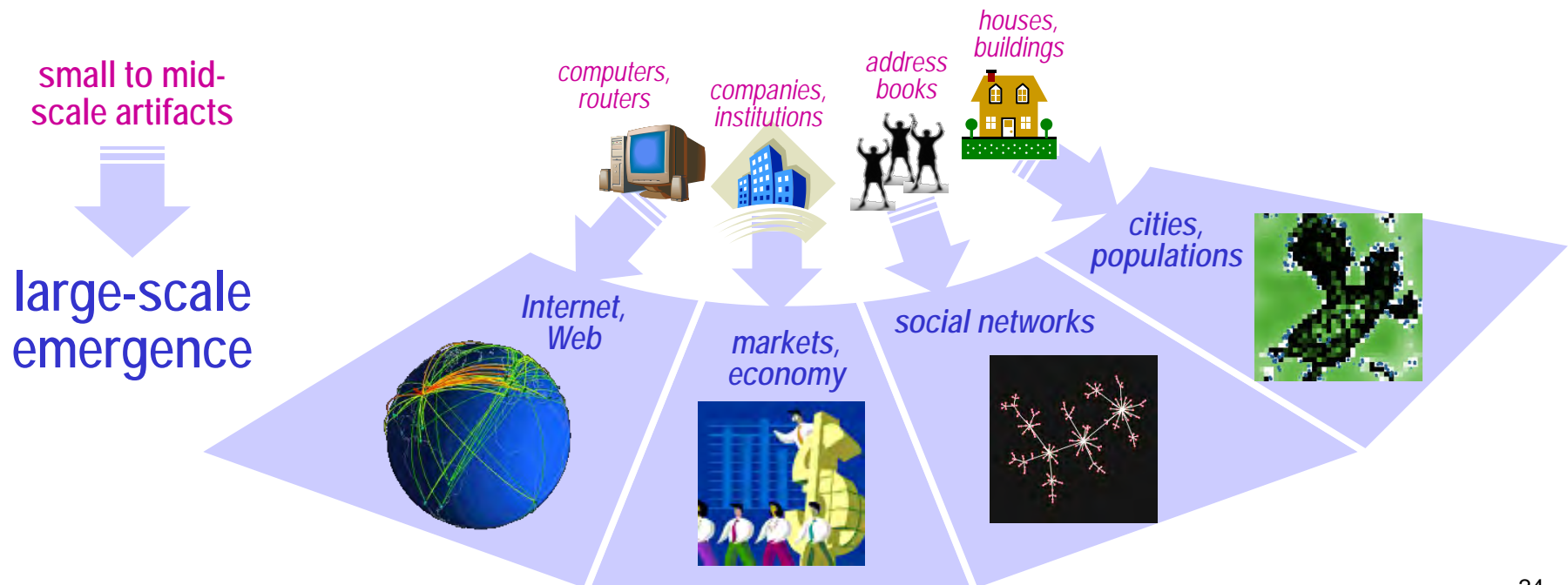
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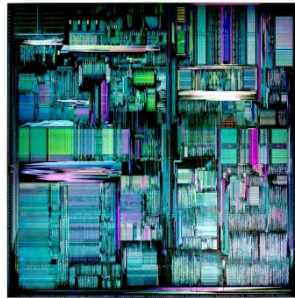
- At large scales, human superstructures are "natural" CS by their unplanned, spontaneous emergence and adaptivity...  
 ... arising from a multitude of traditionally designed artifacts

geography: cities, populations	←	houses, buildings
people: social networks	←	address books
wealth: markets, economy	←	companies, institutions
technology: Internet, Web	←	computers, routers

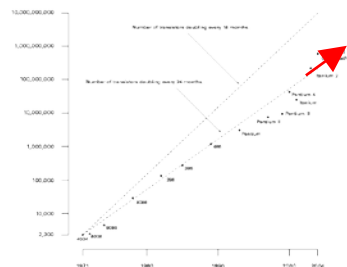


## 2. Architects Overtaken by their Architecture

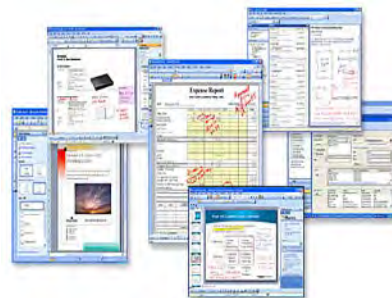
- Burst to large scale: *de facto* complexification of ICT systems
  - ✓ ineluctable breakup into, and *proliferation* of, modules/components



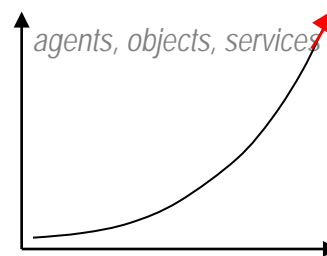
in hardware,



number of transistors/year



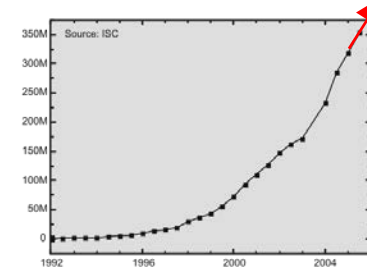
software,



number of O/S lines of code/year



networks...



number of network hosts/year

→ *trying to keep the lid on complexity won't work in these systems:*

- cannot place every part anymore
- cannot foresee every event anymore
- cannot control every process anymore

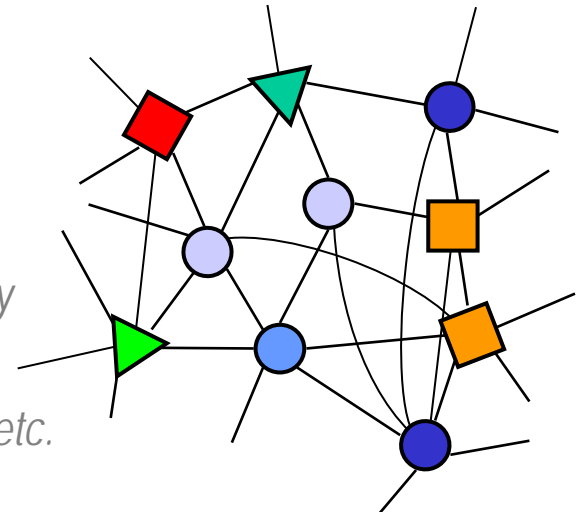
... but do we still *want* to?



## 2. Architects Overtaken by their Architecture

### ➤ Large-scale: *de facto* complexification of organizations, via techno-social networks

- ✓ ubiquitous ICT capabilities connect people and infrastructure in unprecedented ways
- ✓ giving rise to complex techno-social "ecosystems" composed of a multitude of **human users** and **computing devices**
- ✓ explosion in size and complexity in all domains of society:
  - healthcare      ▪ energy & environment
  - education      ▪ defense & security
  - business      ▪ finance
- ✓ from a centralized oligarchy of providers of *data, knowledge, management, information, energy*
- ✓ to a dense heterarchy of **proactive participants**: *patients, students, employees, users, consumers, etc.*



→ in this context, impossible to assign every single participant a predetermined role

# COMPLEX SYSTEMS & COMPUTATION

## 1. What are Complex Systems?

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*Complex systems seem so different from architected systems, and yet...*

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Designed systems that became suddenly complex

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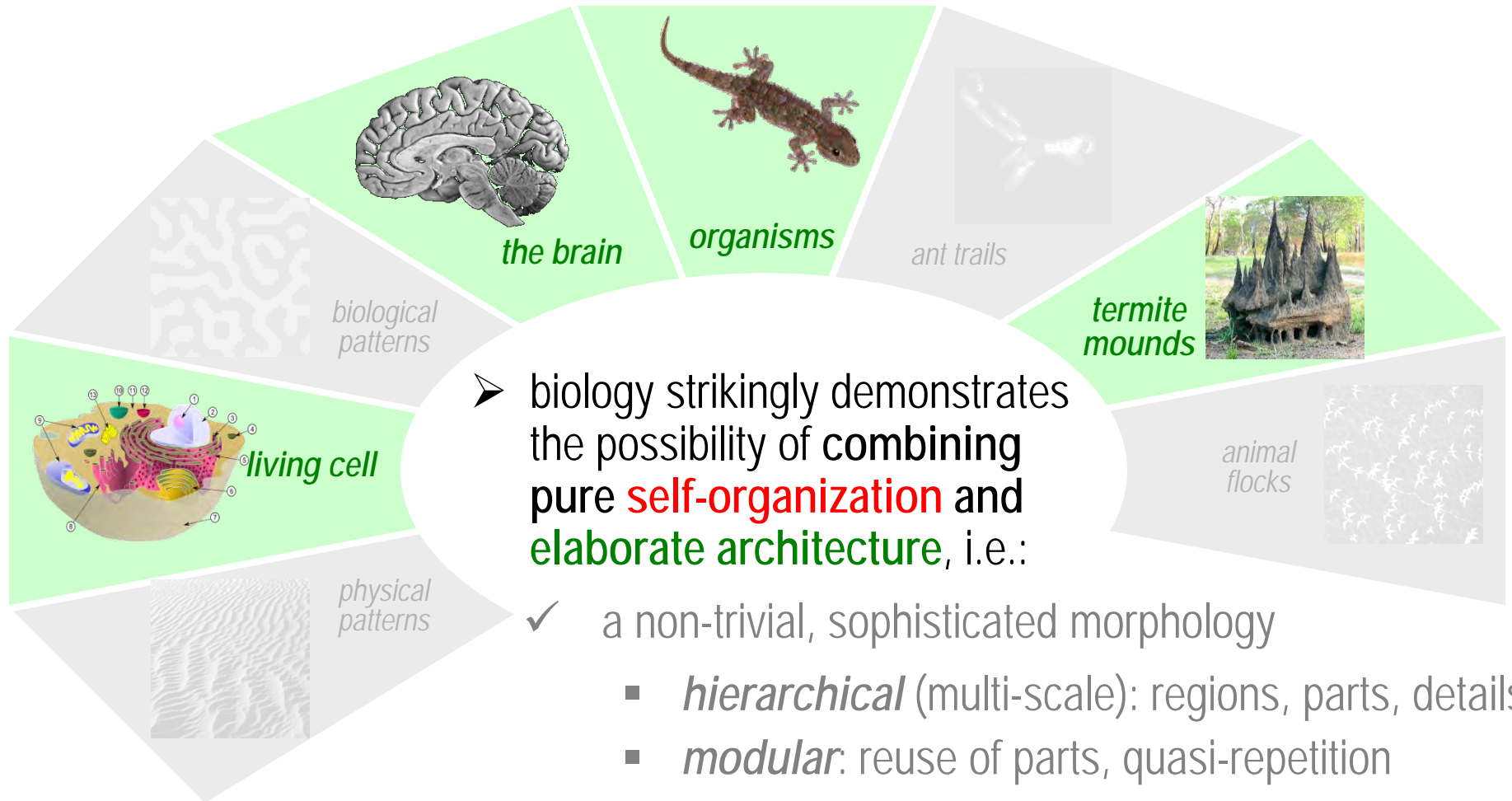
Self-organized systems that *look* like they were designed  
but were not

## 5. A New World of CS Computation

Or how to exploit and organize spontaneity

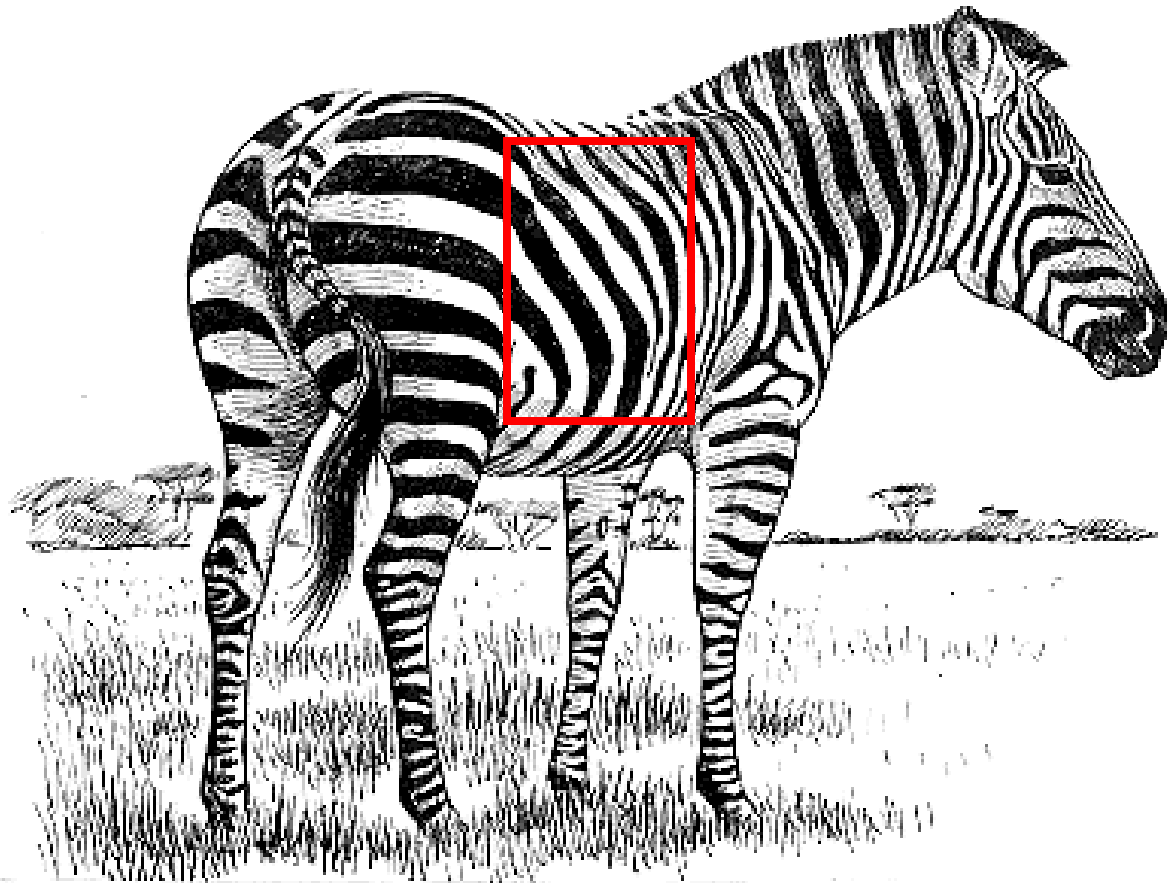
# 3. Architecture Without Architects

➤ "Simple"/random vs. **architected** complex systems



- ✓ a non-trivial, sophisticated morphology
  - *hierarchical* (multi-scale): regions, parts, details
  - *modular*: reuse of parts, quasi-repetition
  - *heterogeneous*: differentiation, division of labor
- ✓ *random* at agent level, *reproducible* at system level

# Pattern Formation → Morphogenesis



*"I have the stripes, but where is the zebra?" OR*  
*"The stripes are easy, it's the horse part that troubles me"*

—attributed to A. Turing, after his 1952 paper on morphogenesis

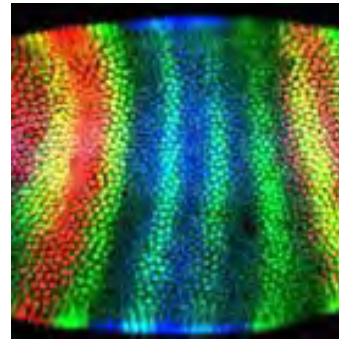
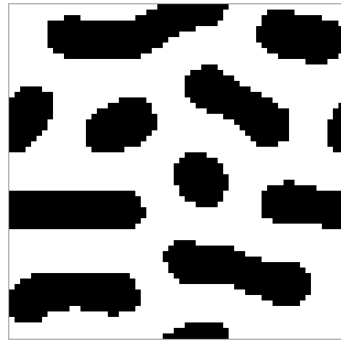


# Statistical vs. morphological systems

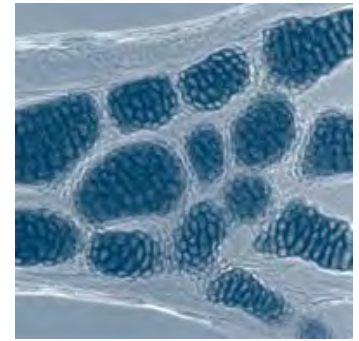
- Physical pattern formation is “free” –  
Biological (multicellular) pattern formation is “guided”



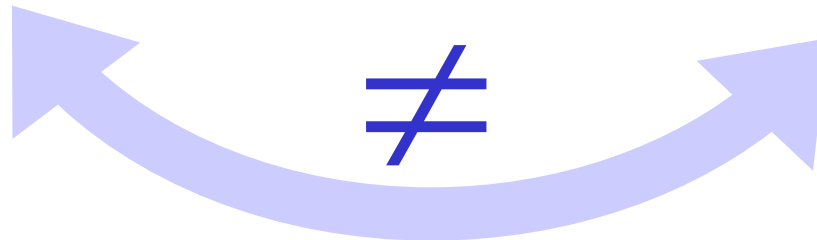
reaction-diffusion  
with NetLogo



fruit fly embryo  
Sean Carroll, U of Wisconsin



larval axolotl limb  
condensations  
Gerd B. Müller



# Statistical vs. morphological systems

➤ Multicellular forms = a bit of “free” + a lot of “guided”

✓ domains of free patterning embedded in a guided morphology

unlike *Drosophila*’s stripes, these pattern primitives are not regulated by different sets of genes depending on their position



spots, stripes in skin  
angelfish, [www.sheddaquarium.org](http://www.sheddaquarium.org)



ommatidia in compound eye  
dragonfly, [www.phy.duke.edu/~hsg/54](http://www.phy.duke.edu/~hsg/54)

✓ repeated copies of a guided form, distributed in free patterns

entire structures (flowers, segments) can become modules showing up in random positions and/or numbers



flowers in tree  
cherry tree, [www.phy.duke.edu/~fortney](http://www.phy.duke.edu/~fortney)



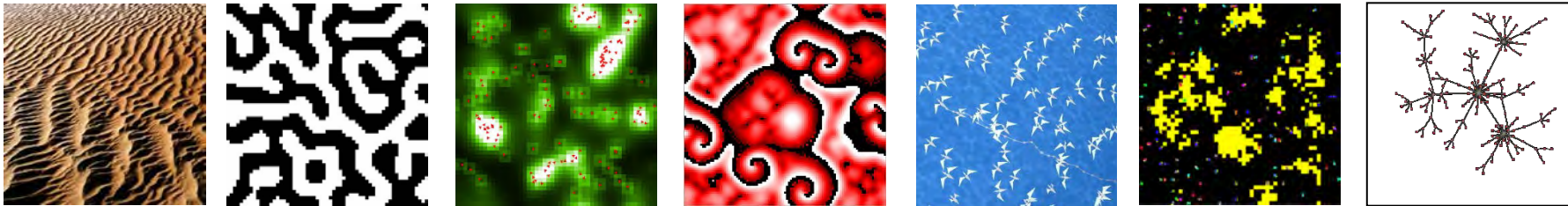
segments in insect  
centipede, [images.encarta.msn.com](http://images.encarta.msn.com)

# 3. Architecture Without Architects

➤ Many self-organized systems exhibit random patterns...

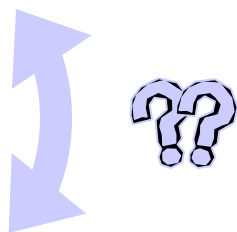
(a) "simple"/random self-organization

NetLogo simulations: Fur, Slime, BZ Reaction, Flocking, Termite, Preferential Attachment



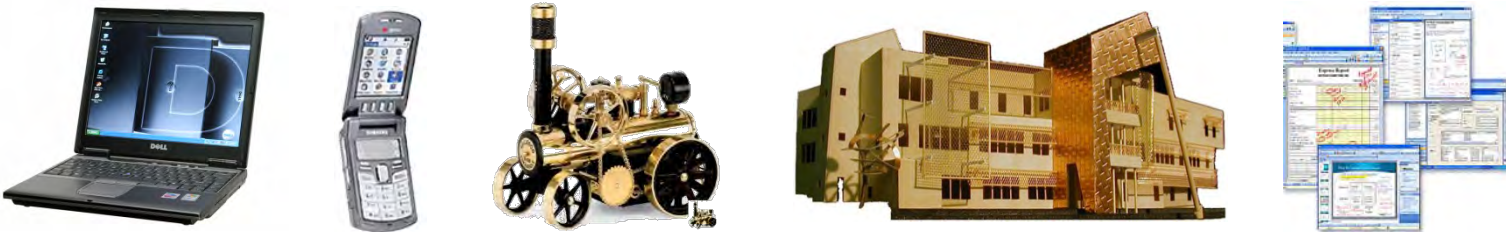
more architecture

gap to fill



... while "complicated" architecture is designed by humans

(d) direct design  
(top-down)

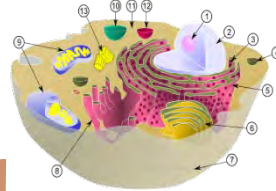


more self-organization

# 3. Architecture Without Architects

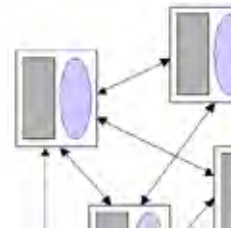
- Many self-organized systems exhibit random patterns...
- The only natural emergent and structured CS are biological
- *Can we transfer some of their principles to human-made systems and organizations?*

(b) natural self-organized architecture

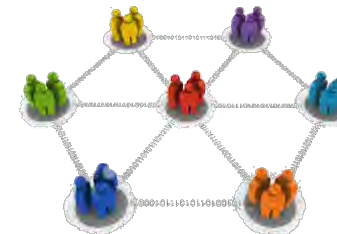


more architecture

(c) engineered self-organization (bottom-up)



SYMBION Project



natural

artificial

more self-organization

- self-forming robot swarm
- self-programming software
- self-connecting micro-components
- self-reconfiguring manufacturing plant
- self-stabilizing energy grid
- self-deploying emergency taskforce
- self-architecting enterprise



# COMPLEX SYSTEMS & COMPUTATION

## 1. What are Complex Systems?

- Decentralization
- Emergence
- Self-organization

## 2. Architects Overtaken by their Architecture

Designed systems that became suddenly complex

## 3. Architecture Without Architects

Self-organized systems that *look* like they were designed  
but were not

## 4. Morphogenetic Engineering

From cells and insects to robots and networks

## 5. A New World of CS Computation

Or how to exploit and organize spontaneity

# 4. Morphogenetic Engineering: Devo

A closer look at morphogenesis: it couples *assembly* and *patterning*

## ➤ Sculpture → forms

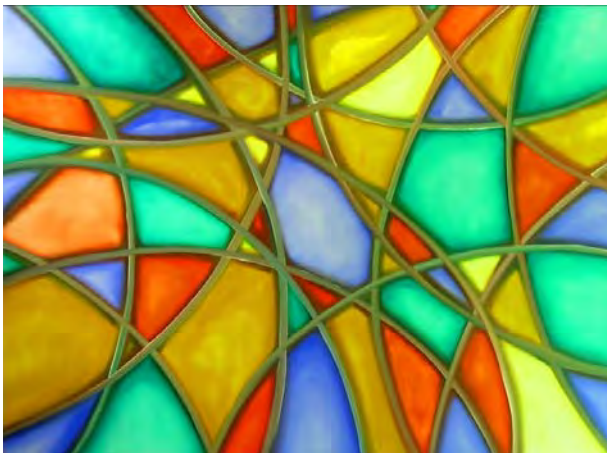
Ádám Szabó, *The chicken or the egg* (2005)  
<http://www.szaboadam.hu>



## "shape from patterning"

- ✓ the *forms* are "sculpted" by the self-assembly of the elements, whose behavior is triggered by the *colors*

## ➤ Painting → colors



## "patterns from shaping"

- ✓ new *color* regions appear (domains of genetic expression) triggered by *deformations*



Niki de Saint Phalle

# 4. Morphogenetic Engineering: Devo

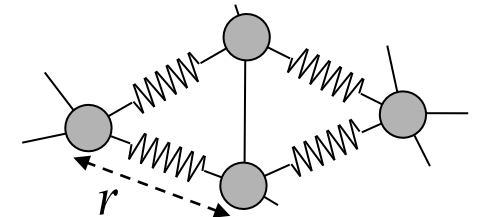
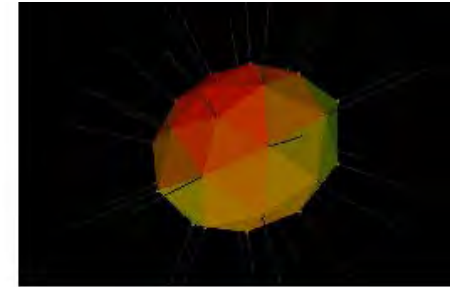
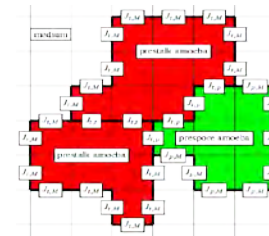
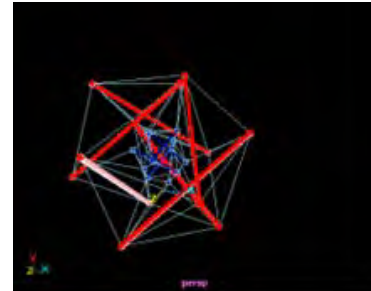
A closer look at morphogenesis:  $\Leftrightarrow$  it couples *mechanics* and *genetics*

## ➤ Cellular mechanics

- ✓ adhesion
- ✓ deformation / reformation
- ✓ migration (motility)
- ✓ division / death

tensional integrity  
(Ingber)

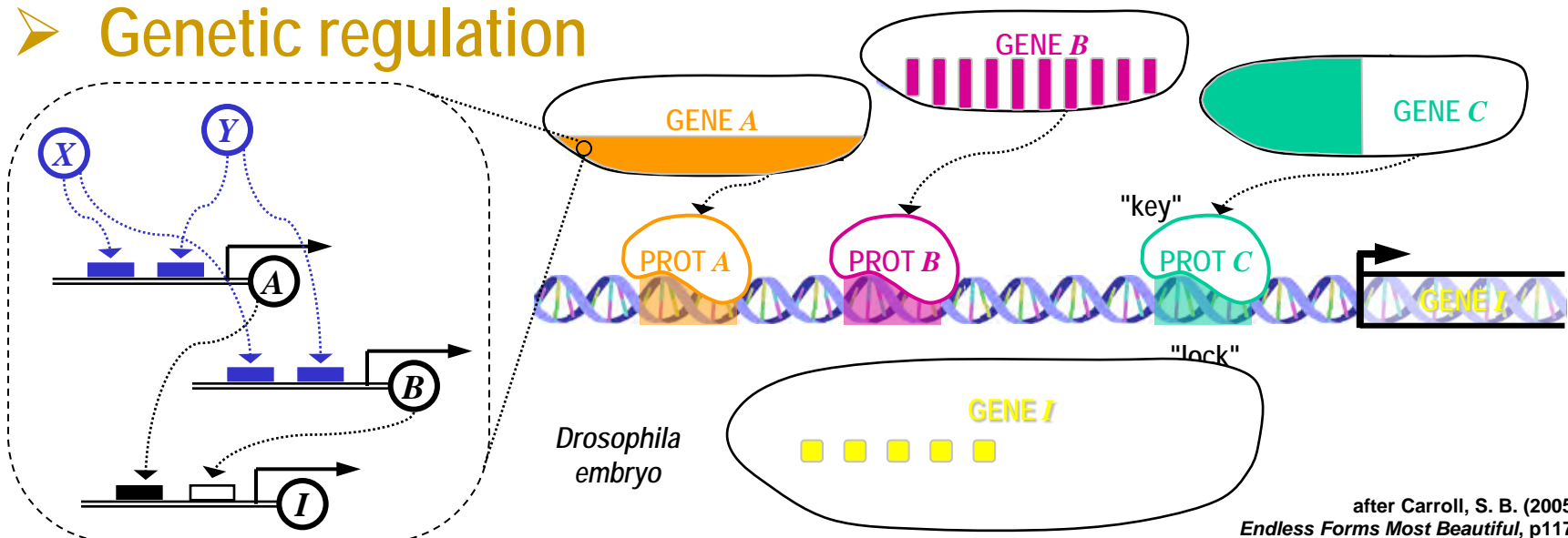
cellular Potts model  
(Graner, Glazier, Hogeweg)



(Dellie & Doursat)

(Doursat)

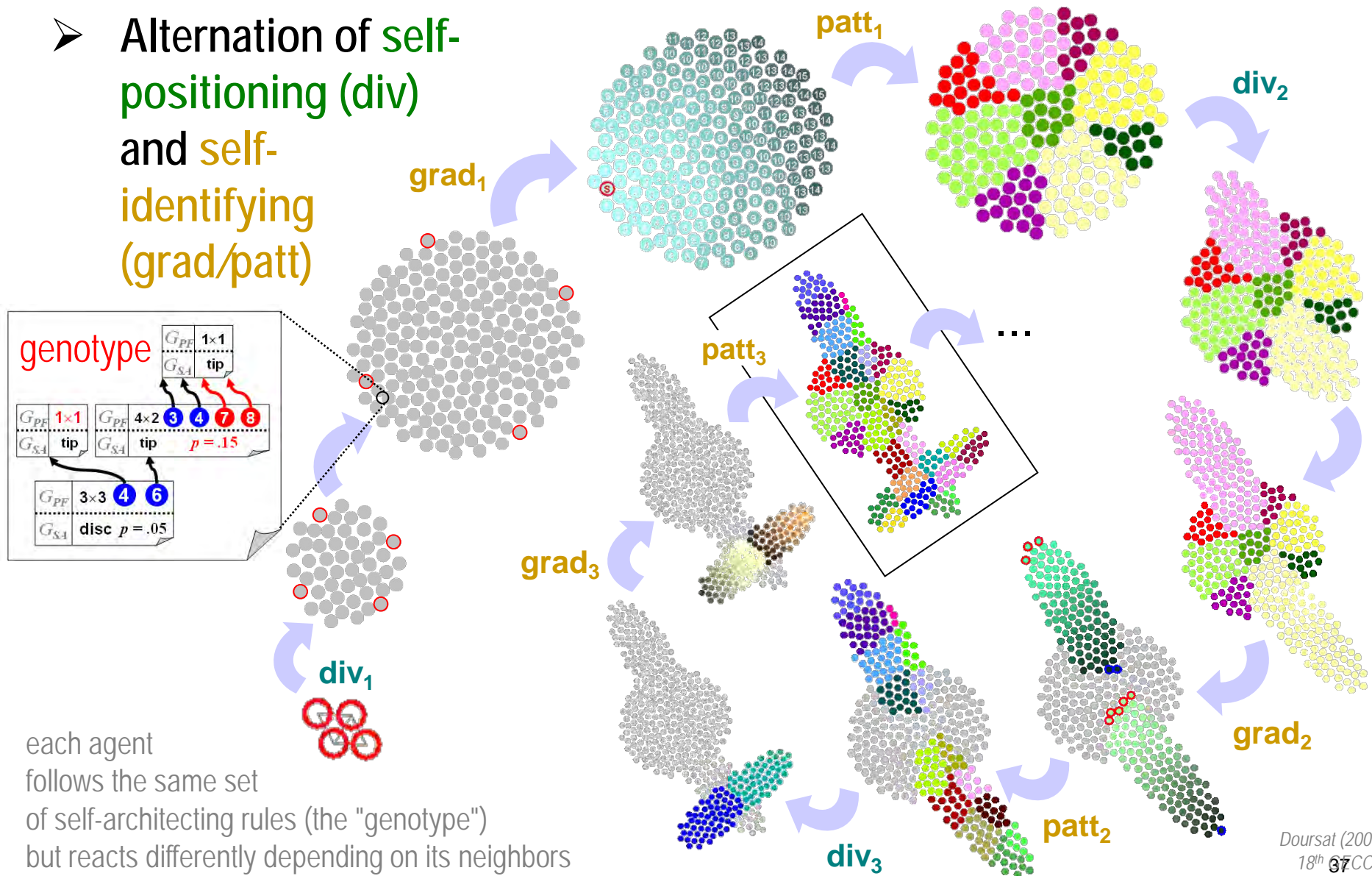
## ➤ Genetic regulation



# 4. Morphogenetic Engineering: Devo

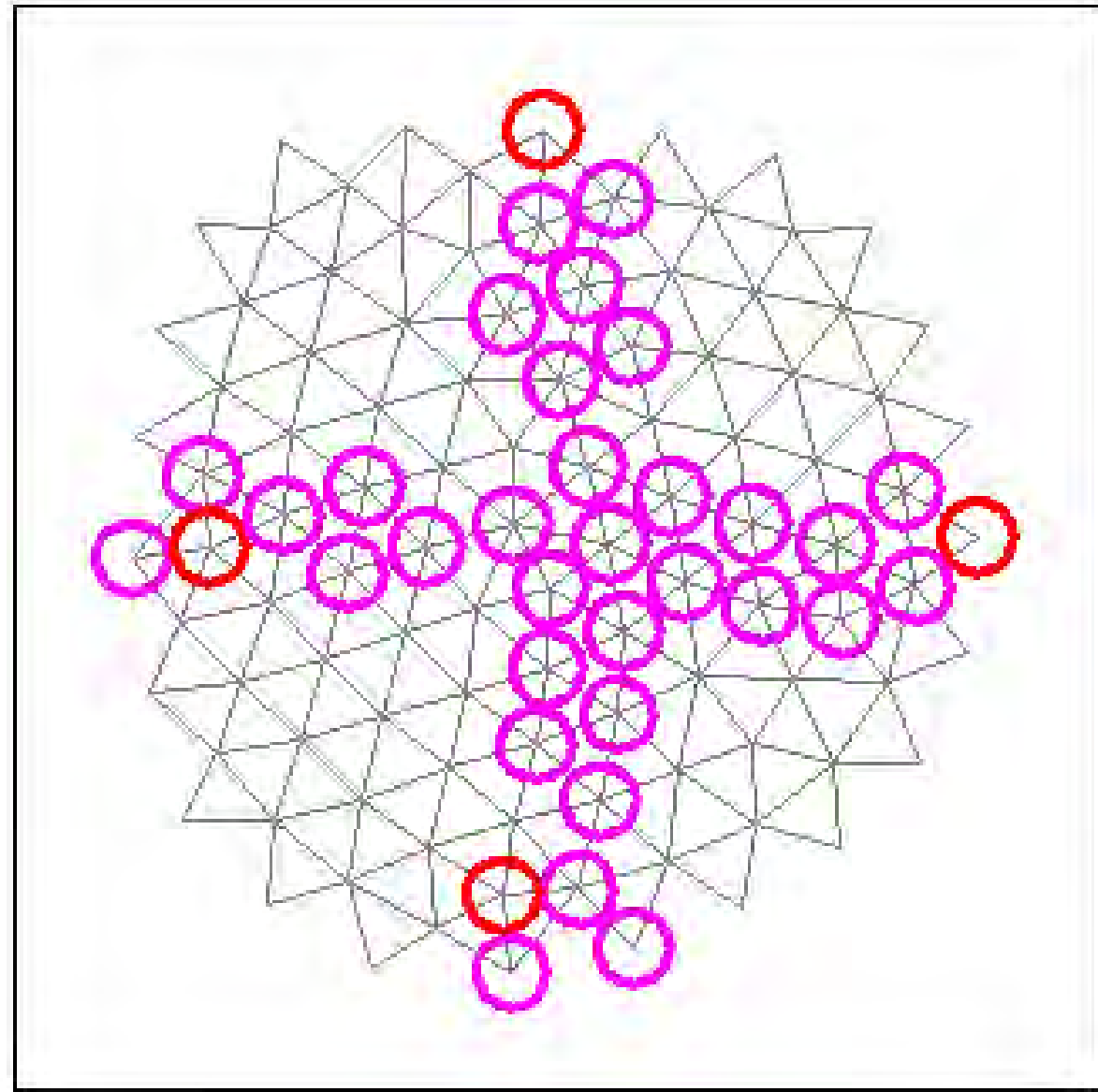
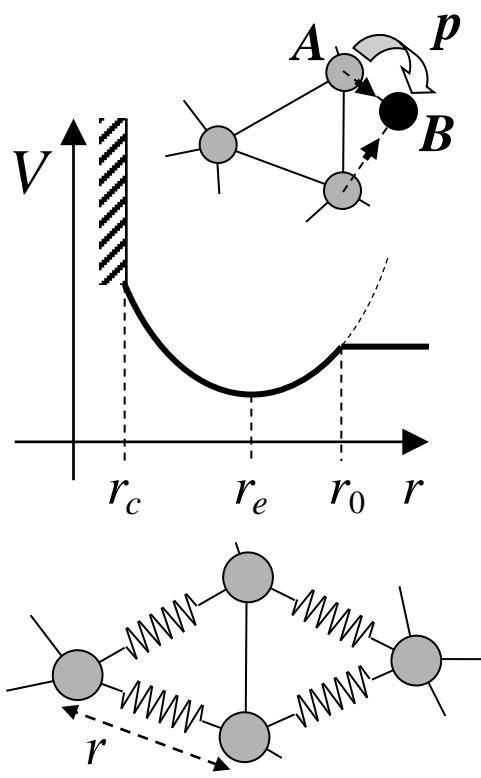
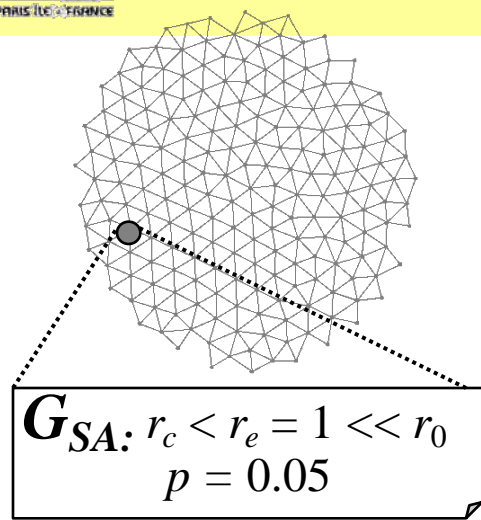
*Capturing the essence of morphogenesis in an Artificial Life agent model*

- Alternation of **self-positioning (div)** and **self-identifying (grad/patt)**

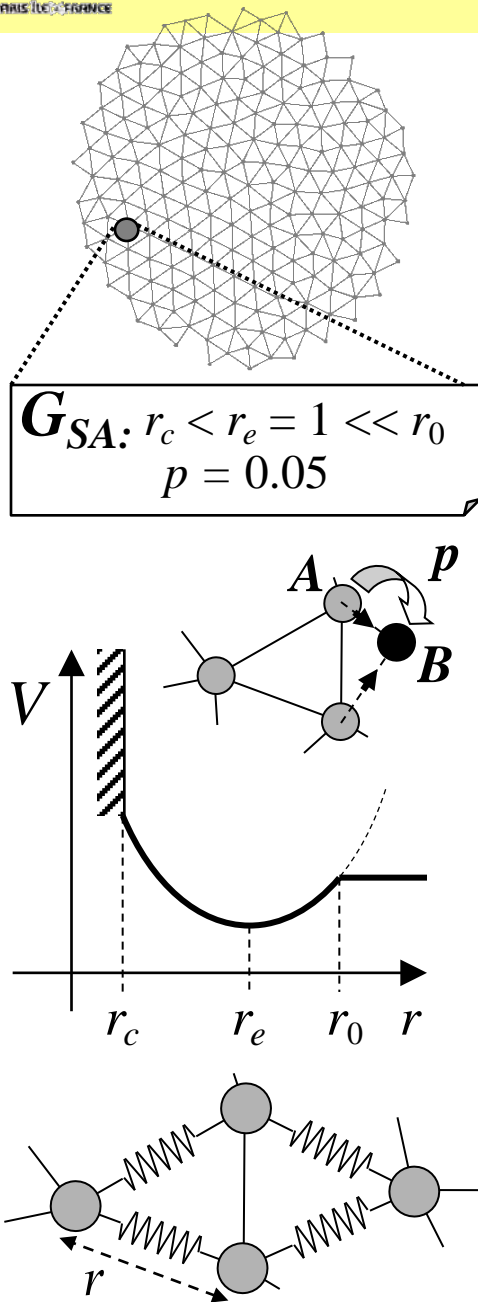




# 4. Morphogenetic Engineering: Devo



# 4. Morphogenetic Engineering: Devo



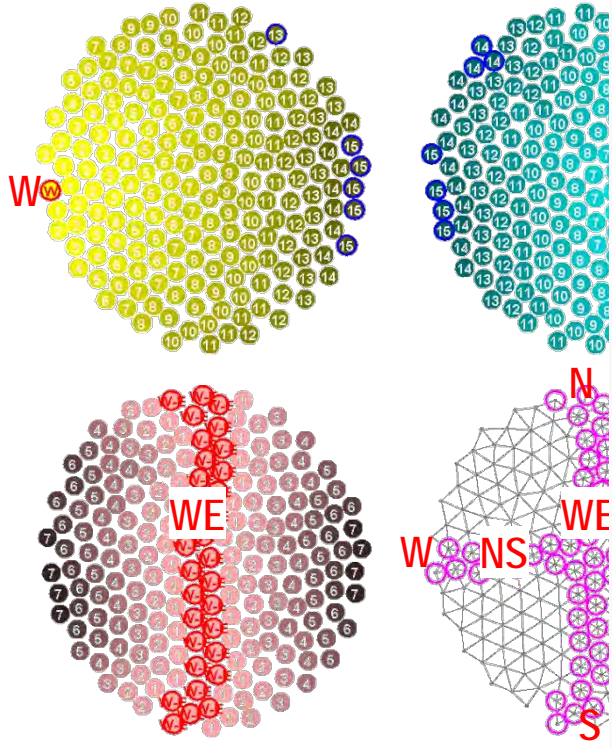
$$m\ddot{\mathbf{r}}^{cd} = -k \left( 1 - \frac{r_0}{\|\mathbf{r}^{cd}\|} \right) \mathbf{r}^{cd} - \eta \dot{\mathbf{r}}^{cd}.$$

$\Downarrow$

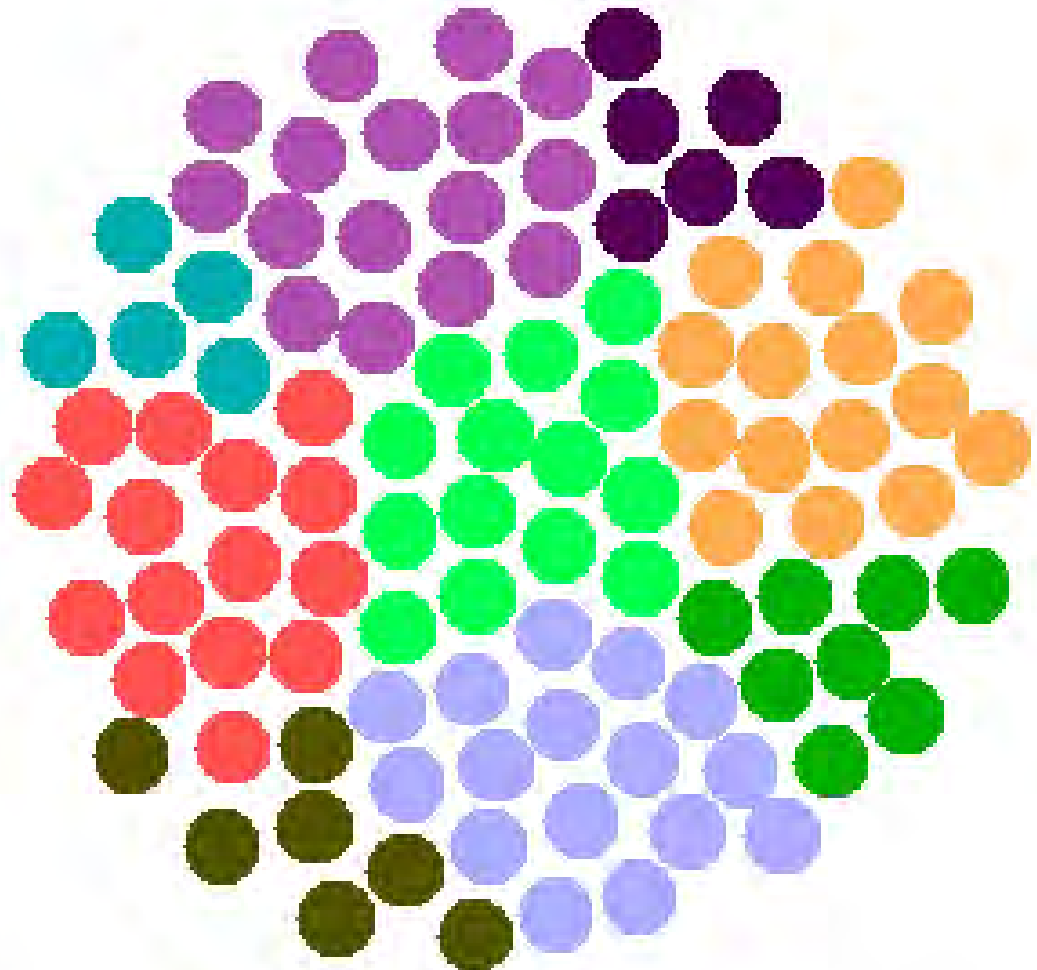
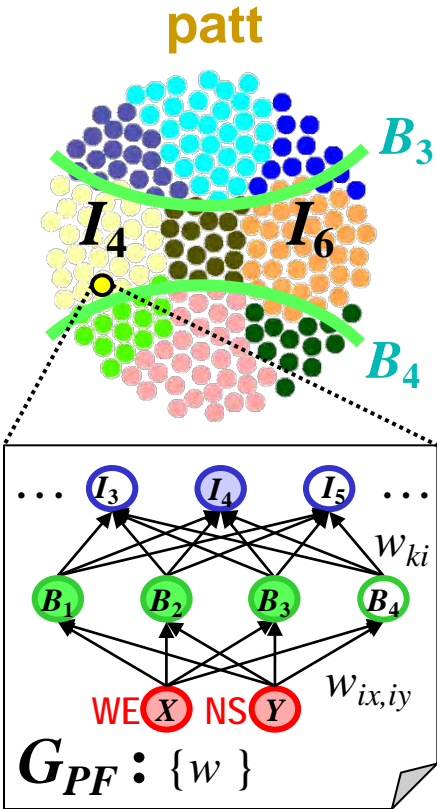
$$\Delta \mathbf{r}^c = -\Delta \mathbf{r}^d = \frac{\Delta \mathbf{r}^{cd}}{2} = -\frac{k}{2\eta} \left( 1 - \frac{r_0}{\|\mathbf{r}^{cd}\|} \right) \mathbf{r}^{cd}.$$

# 4. Morphogenetic Engineering: Devo

grad



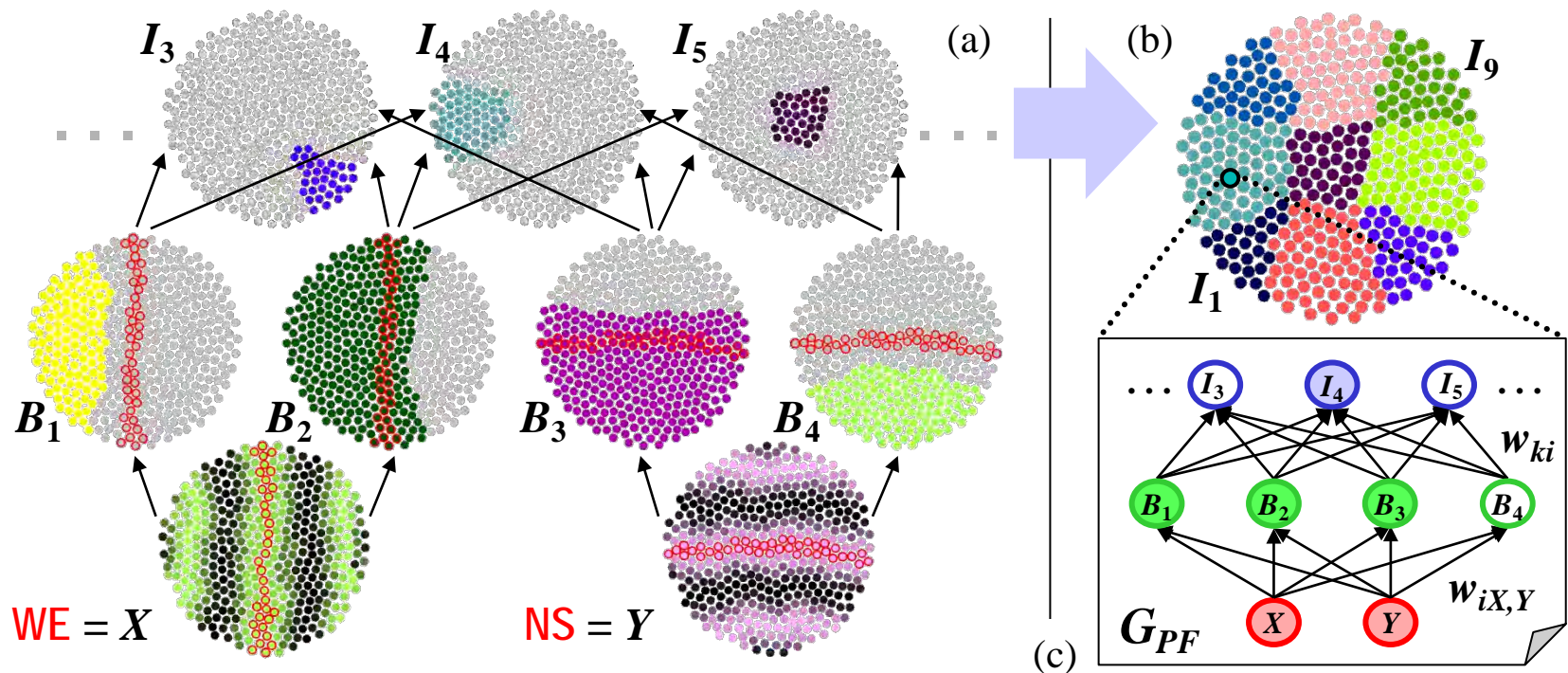
# 4. Morphogenetic Engineering: Devo

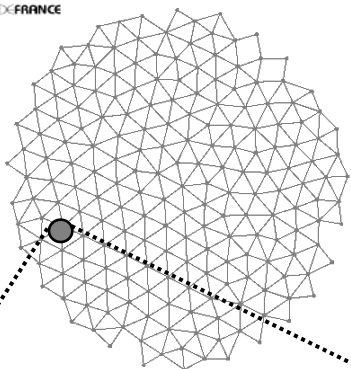




# 4. Morphogenetic Engineering

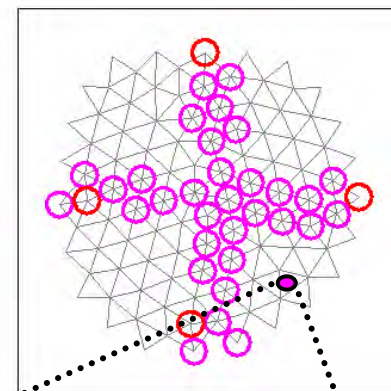
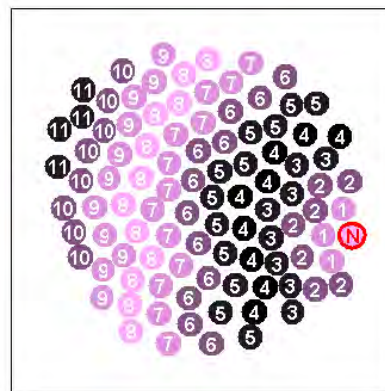
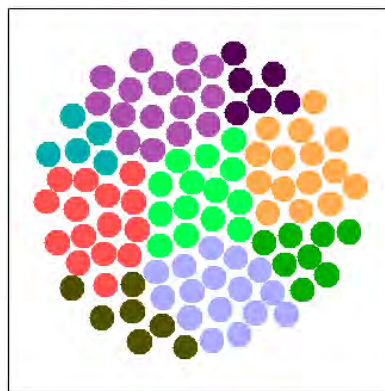
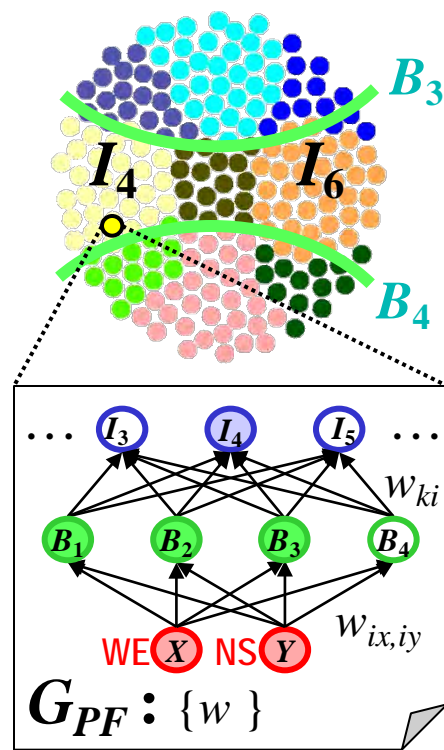
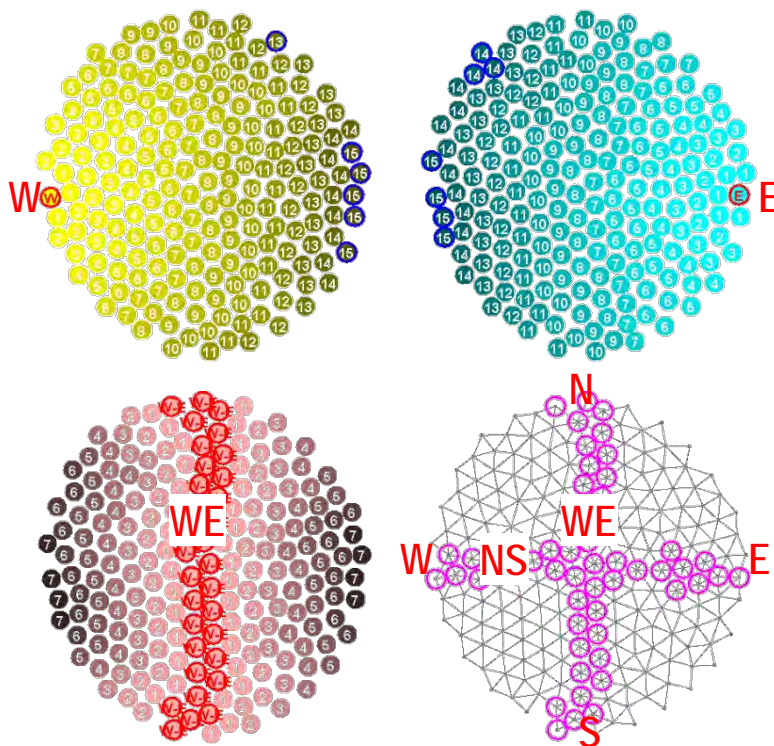
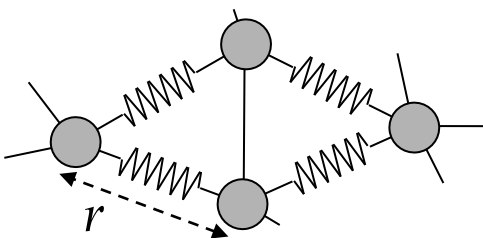
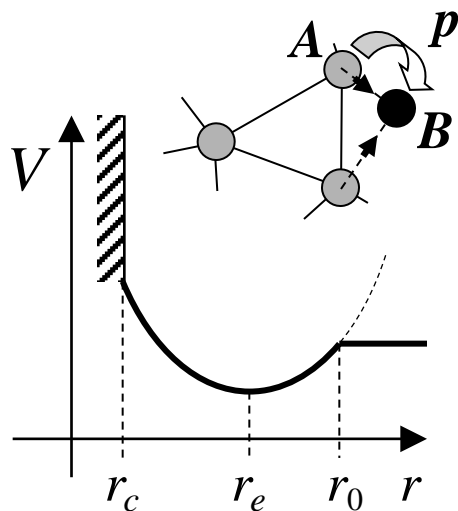
- Programmed patterning (**patt**): the hidden embryo atlas
  - a) same swarm in different colormaps to visualize the agents' internal patterning variables  $X$ ,  $Y$ ,  $B_i$  and  $I_k$  (virtual *in situ* hybridization)
  - b) consolidated view of all identity regions  $I_k$  for  $k = 1 \dots 9$
  - c) gene regulatory network used by each agent to calculate its expression levels, here:  $B_1 = \sigma(1/3 - X)$ ,  $B_3 = \sigma(2/3 - Y)$ ,  $I_4 = B_1 B_3 (1 - B_4)$ , etc.





$$G_{SA} : r_c < r_e = 1 \ll r_0$$

$$p = 0.05$$



# 4. Morphogenetic Engineering

## ➤ Morphological refinement by iterative growth

- ✓ details are not created in one shot, but gradually added. . .



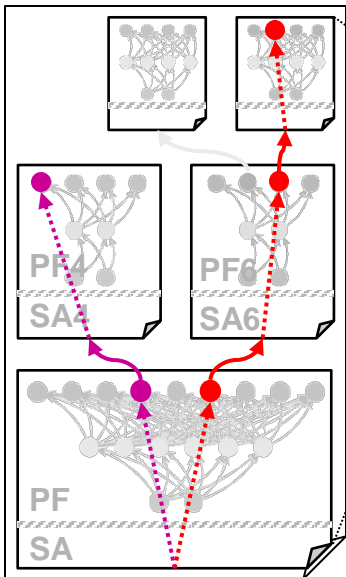
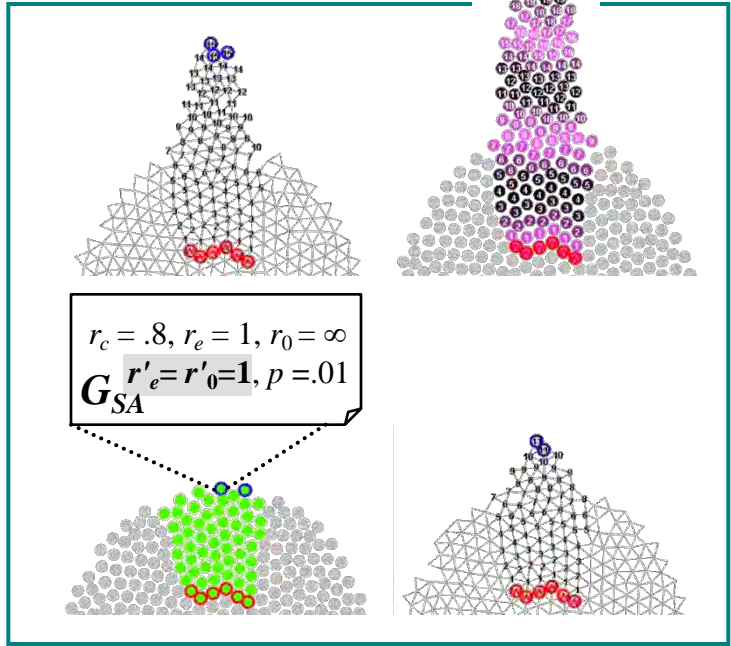
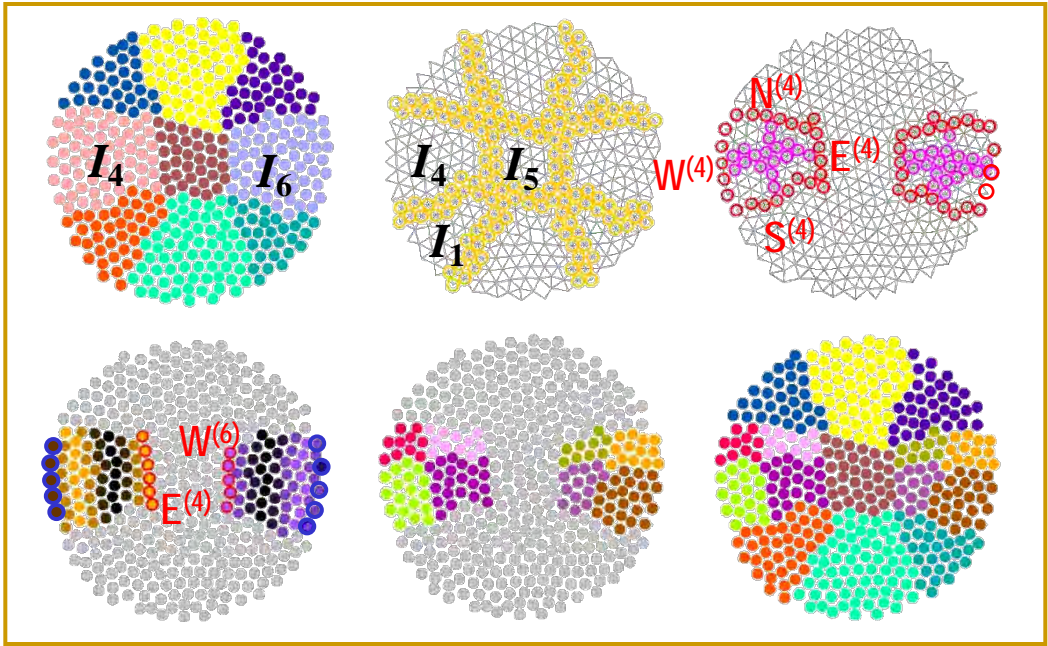
- ✓ . . . while, at the same time, the canvas grows



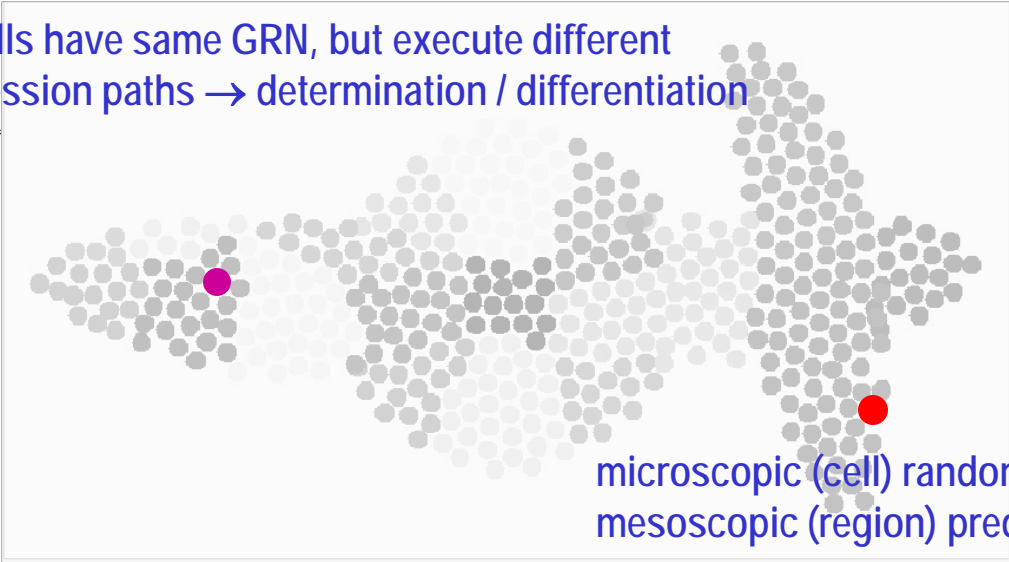
from Coen, E. (2000)  
*The Art of Genes*, pp131-135



# 4. Morphogenetic Engineering: Devo



all cells have same GRN, but execute different expression paths → determination / differentiation



microscopic (cell) randomness, but mesoscopic (region) predictability

Doursat (2008)  
ALIFE XI

## 4. Morphogenetic Engineering: Devo

### ➤ Derivative projects

ME: Devo-Evo

ME: Devo-MecaGen

ME: Devo-Bots

ME: Devo-SynBioTIC

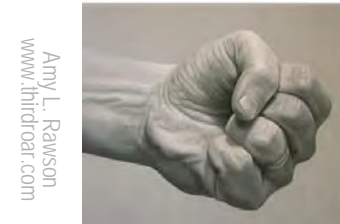
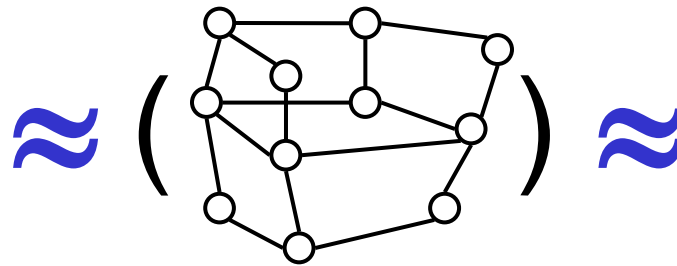
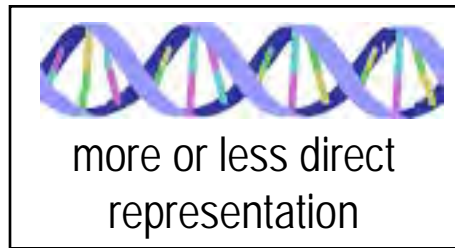
ME: ProgNet-Ecstasy

ME: ProgNet



# 4. Morphogenetic Engineering: Devo-Evo

## ➤ The missing link of the Modern Synthesis...

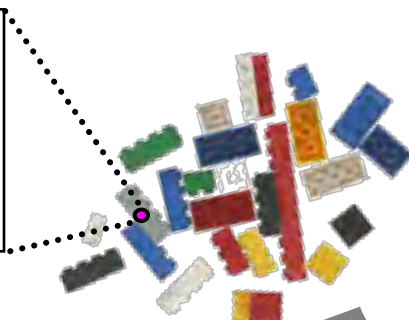
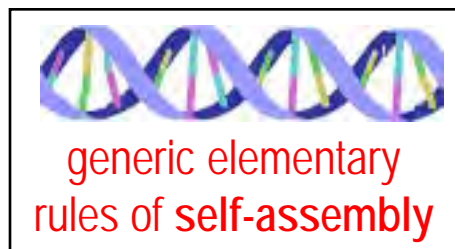


*macroscopic,  
emergent level*

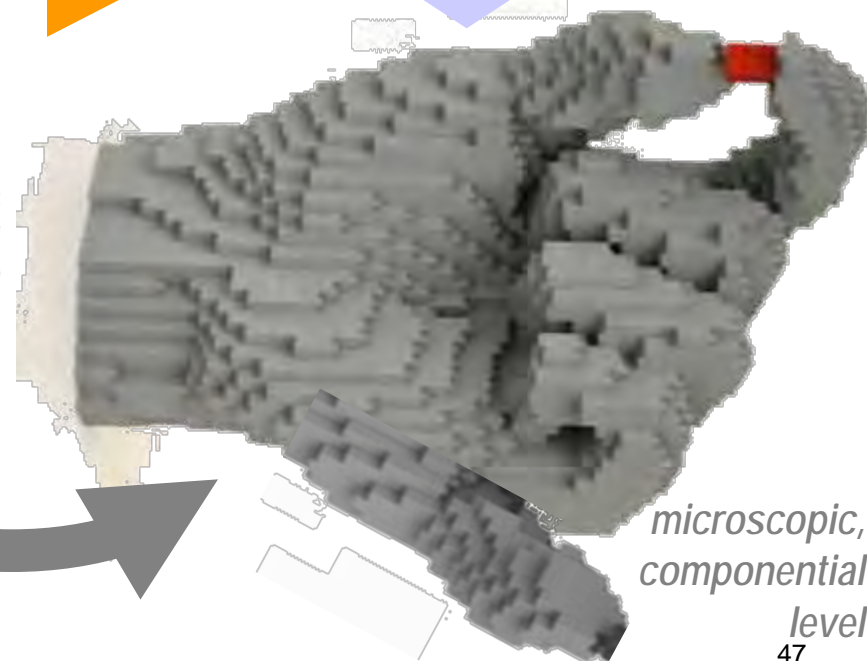
Genotype



Phenotype



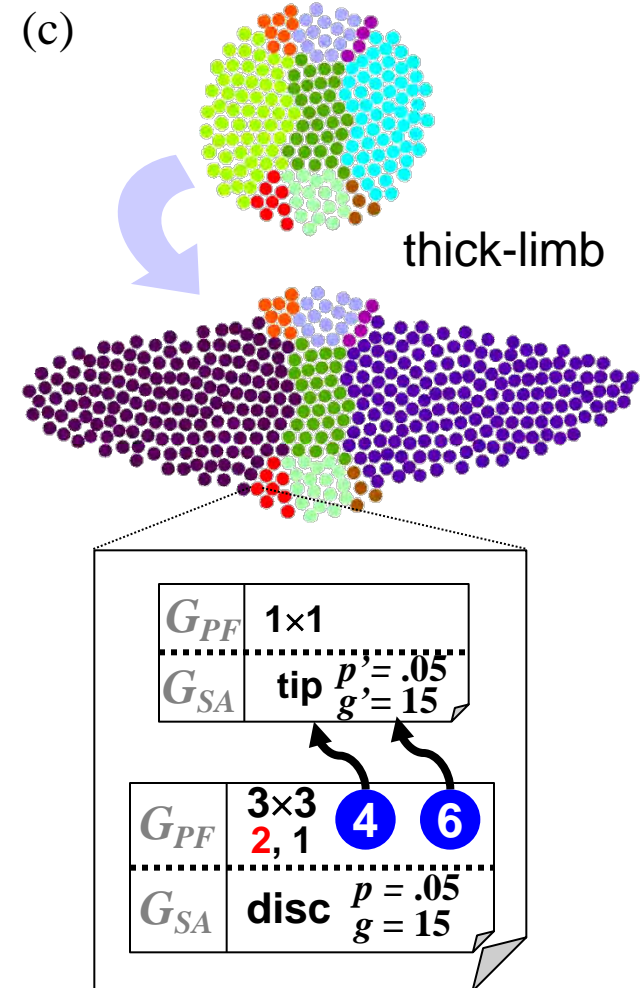
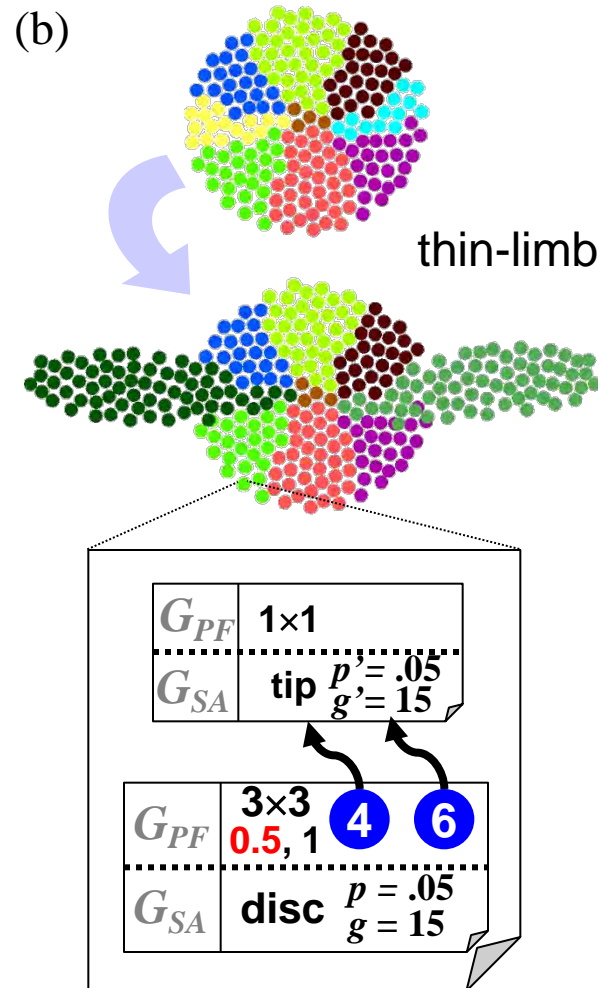
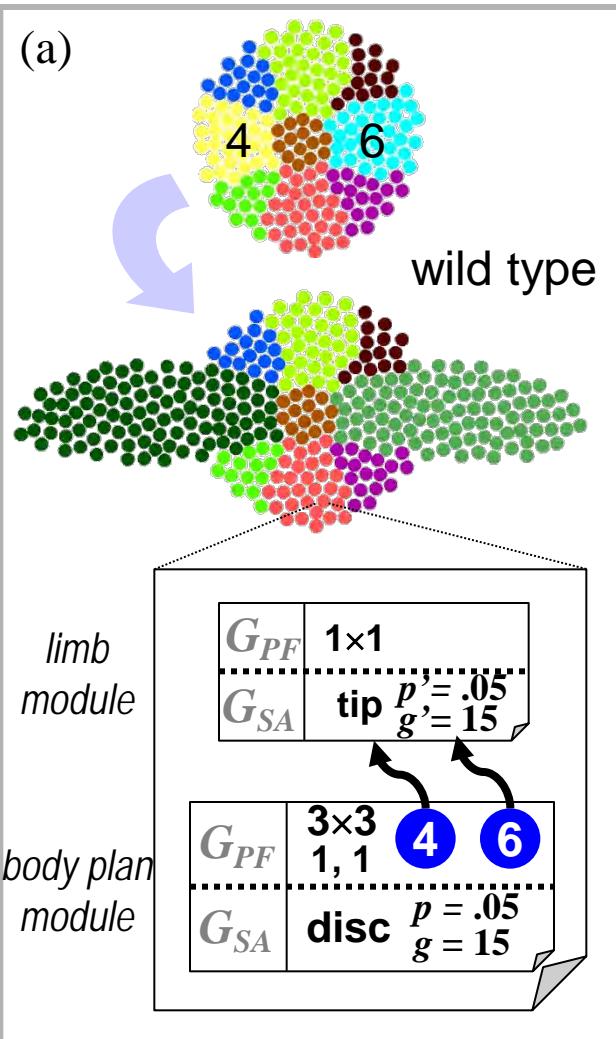
Nathan Sawaya  
[www.brickartist.com](http://www.brickartist.com)



*microscopic,  
componential  
level*

# 4. Morphogenetic Engineering: Devo-Evo

## ➤ Quantitative mutations: limb thickness



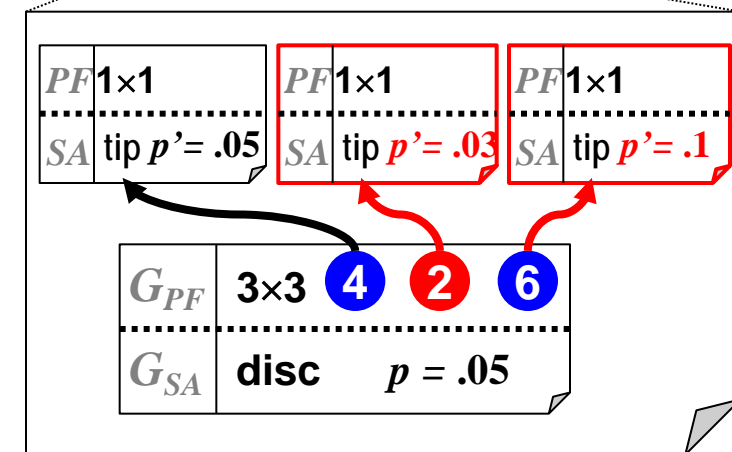
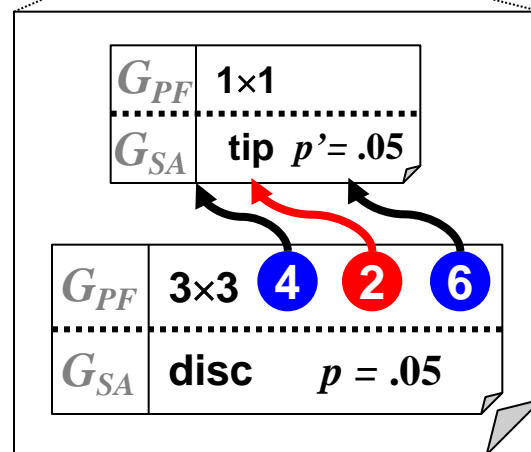
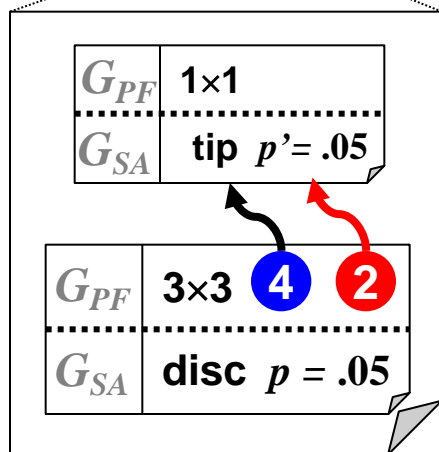
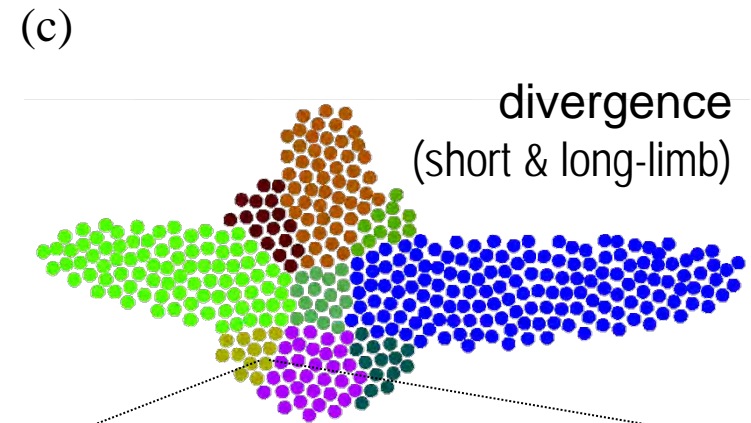
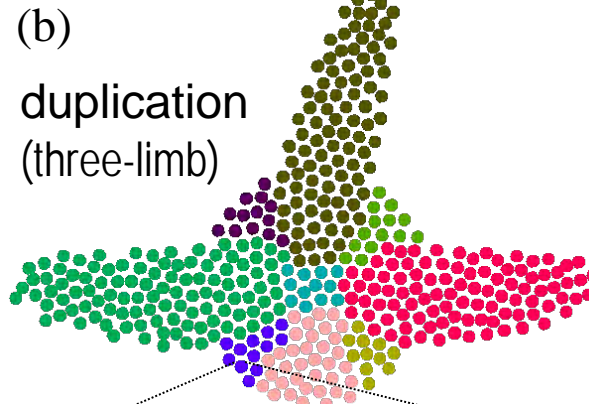
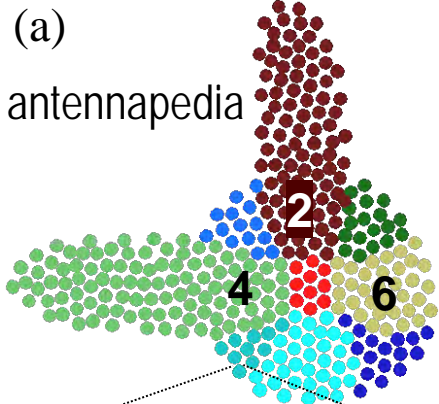
# 4. Morphogenetic Engineering: Devo-Evo

## ➤ Qualitative mutations: limb position and differentiation

antennapedia

*homology* by duplication

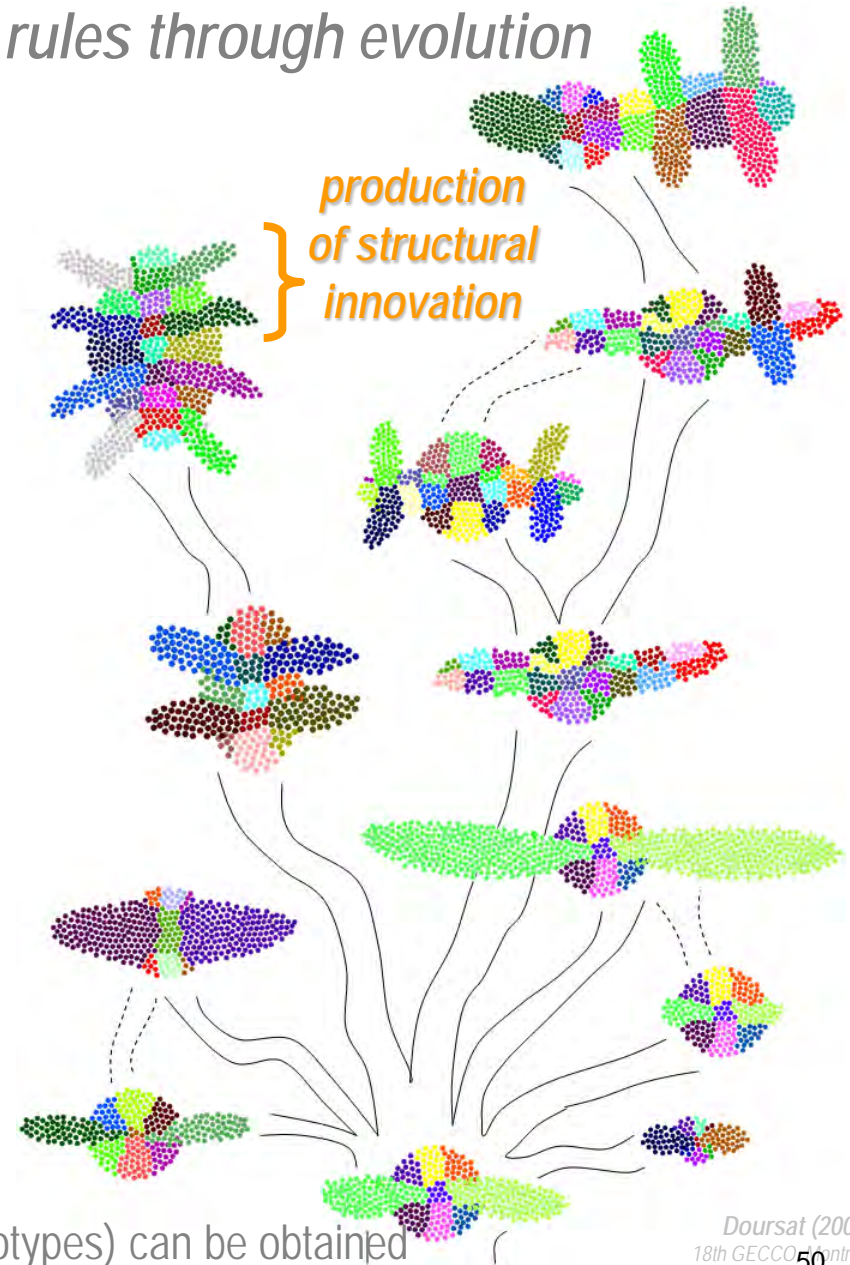
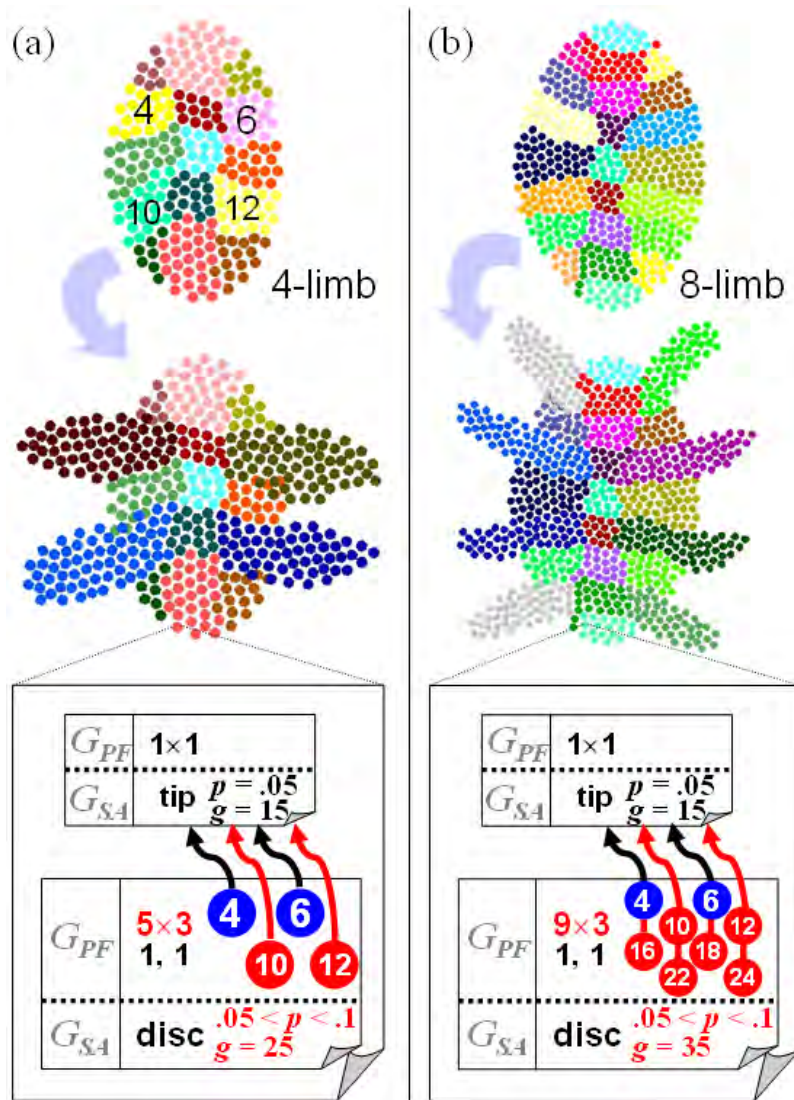
divergence of the homology





# 4. Morphogenetic Engineering: Devo-Evo

*Changing the agents' self-architecting rules through evolution*

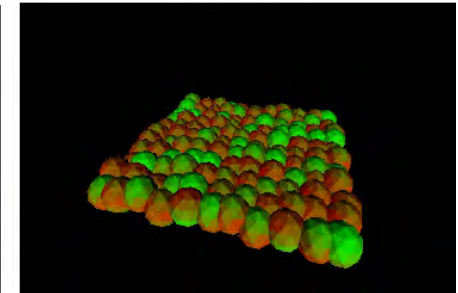
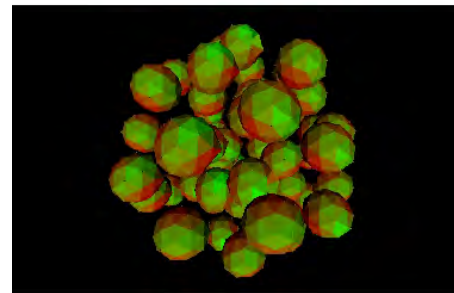
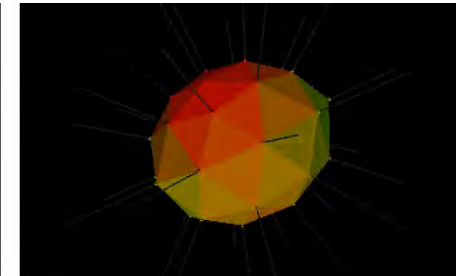
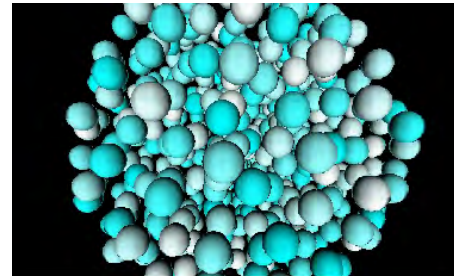


by tinkering with the genotype, new architectures (phenotypes) can be obtained

# 4. Morphogenetic Engineering: Devo-MecaGen

## ➤ More accurate mechanics

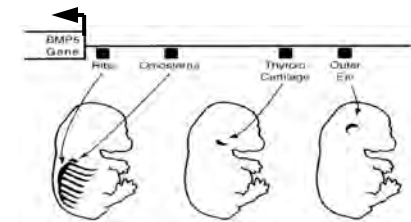
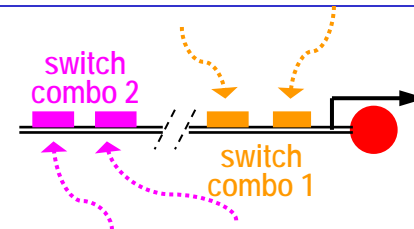
- ✓ 3-D
- ✓ individual cell shapes
- ✓ collective motion, migration
- ✓ adhesion



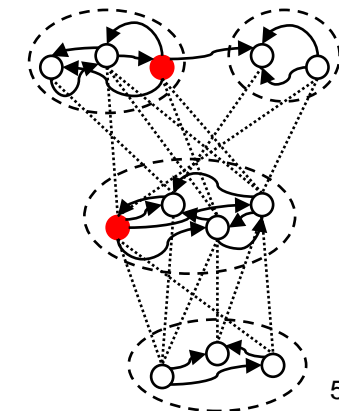
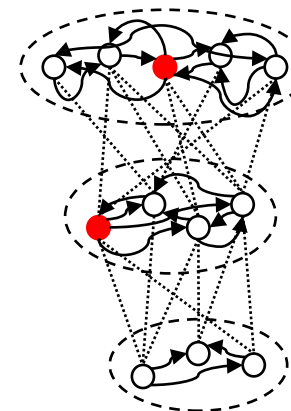
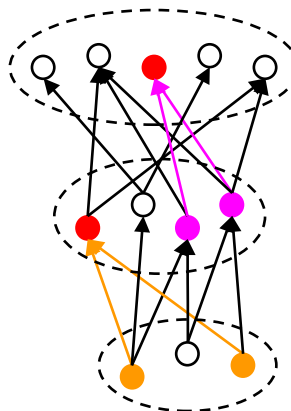
(Delille, Doursat, Peyrieras)

## ➤ Better gene regulation

- ✓ recurrent links
- ✓ gene reuse
- ✓ kinetic reaction ODEs
- ✓ attractor dynamics



after David Kingsley,  
in Carroll, S. B. (2005)  
*Endless Forms  
Most Beautiful*, p125



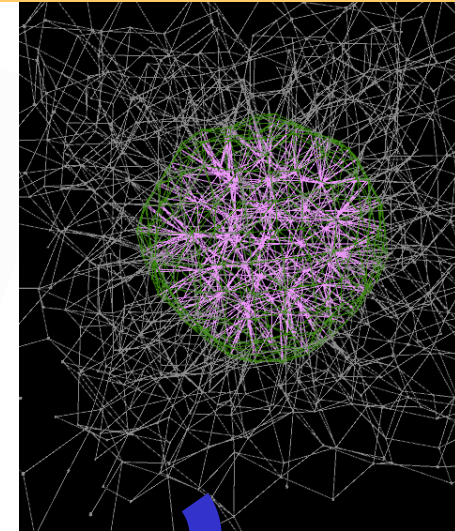
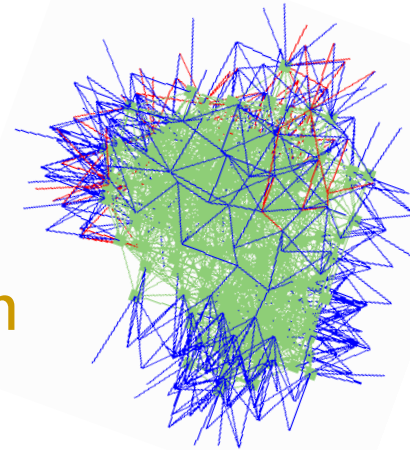


# 4. Morphogenetic Engineering: Devo-MecaGen

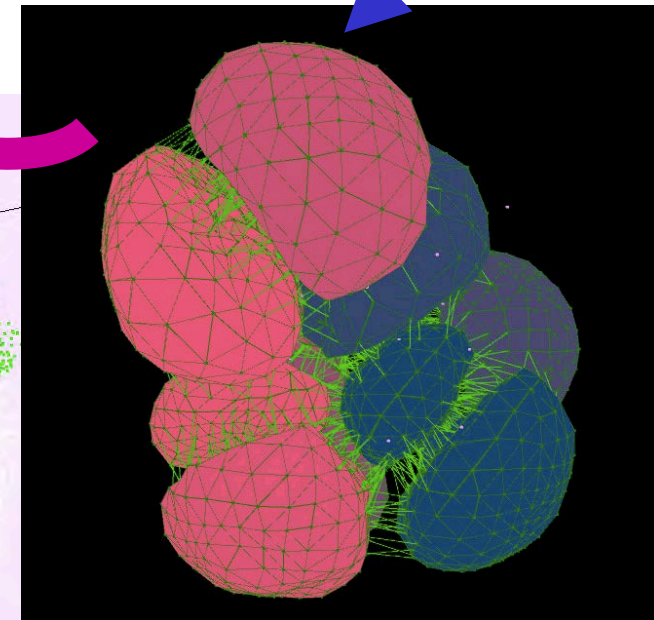
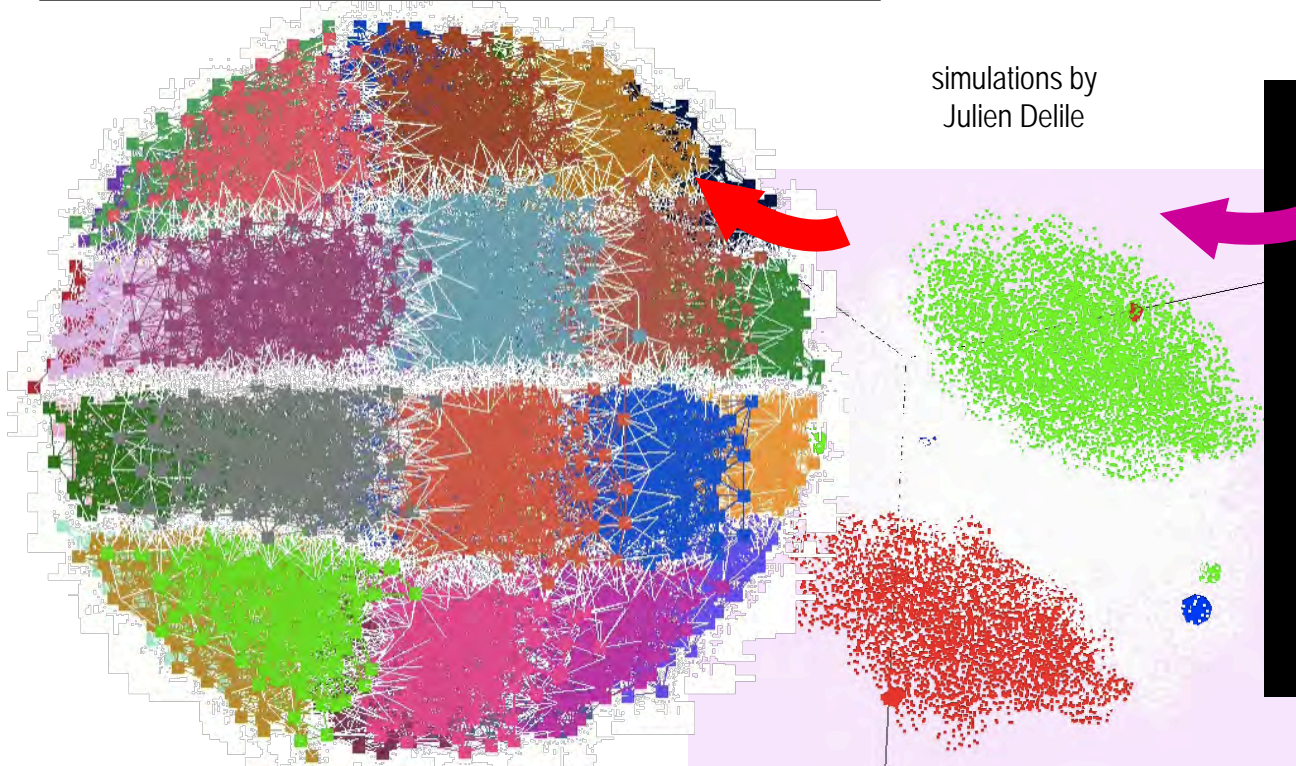
- Multi-agent embryogenesis
  - ✓ 3D particle-based mechanics
  - ✓ kinetic-based gene regulation

PhD student: **Julien Delile** (FdV, DGA), co-supervised by

- Nadine Peyri ras, CNRS Gif s/Yvette
- (St phane Doncieux, LIP6)



simulations by  
Julien Delile



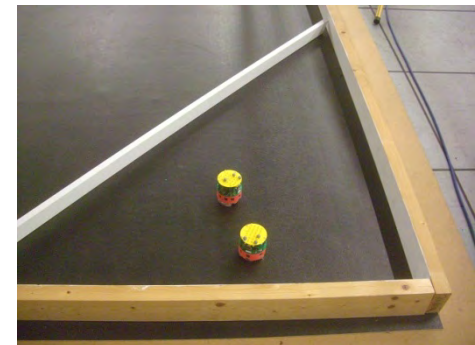
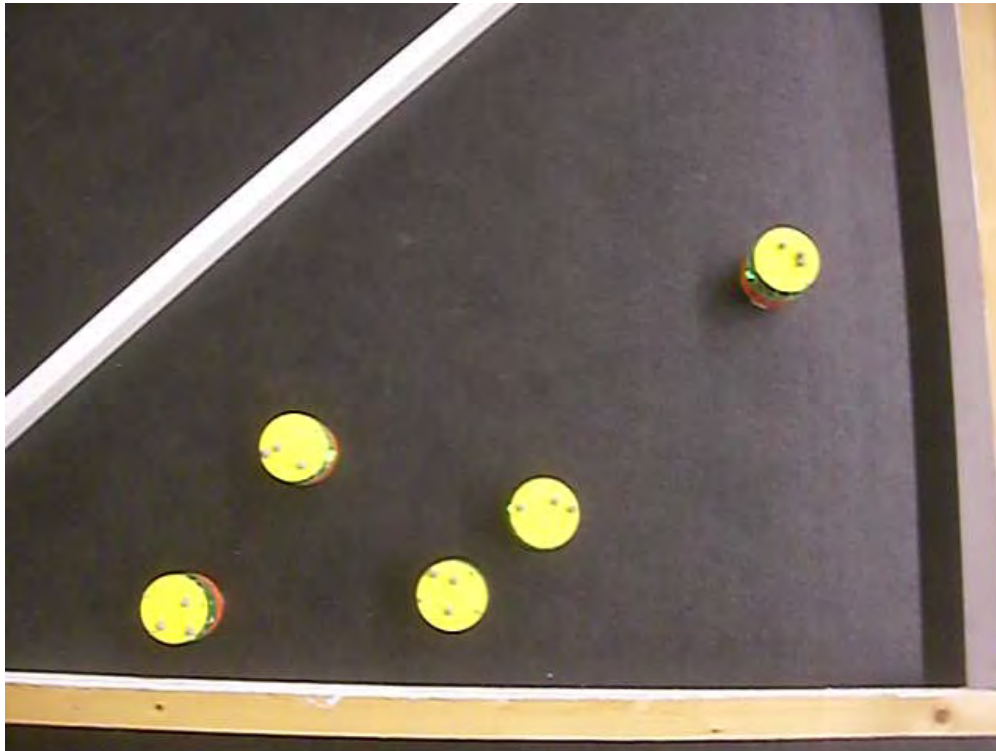
# 4. Morphogenetic Engineering: Devo-Bots

## ➤ Morphogenetic swarm robotics: toward structured robot flocking

✓ using "e-pucks"

Current collaboration with

- Alan Winfield, Bristol Robotics Lab, UWE
- Wenguo Liu, Bristol Robotics Lab, UWE

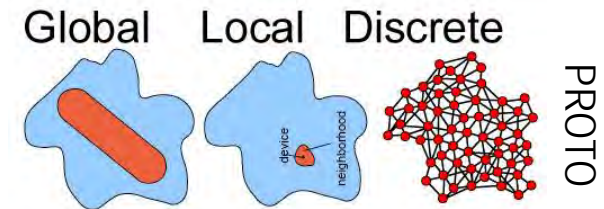




## ➤ Synthetic Biological SysTems: from Design to Compilation

ANR Project with (among others)

- Jean-Louis Giavitto, ex-IBISC, Evry
- Oliver Michel, A. Spicher, LACL, Creteil
- Franck Delaplace, Evry ... et al.



- ex: spatial computing languages: PROTO (Beal) and MGS (Giavitto)

### La prise en compte du spatial

[Même] si pour l'instant la biologie synthétique se focalise sur la « programmation d'une seule bactérie », le développement de biosystèmes un tant soit peu complexe reposera sur le **fonctionnement intégré de colonies bactériennes** et donc sur la prise en compte d'**interactions spatiales** au sein d'une **population de cellules différenciées**. [...]

La maîtrise des interactions spatiales ouvre la voie à une **ingénierie du développement [biologique]**, ce qui permet de rêver à des applications qui vont **bien au-delà de la conception de la cellule comme « usine chimique »**.

# 4. Morphogenetic Engineering: ProgNet-ECSTASY

## ➤ Engineering Complex Socio-Technical Adaptive SYstems

Submitted FET-ICT Open Project with

- Jeremy Pitt, Imperial College, London
- Andrzej Nowak, U Warsaw
- Mihaela Ulieru, Canada Research Chair



The ECSTASY project is about the science of socio-technical combinatorics underpinning the ICT for engineering such scenarios.

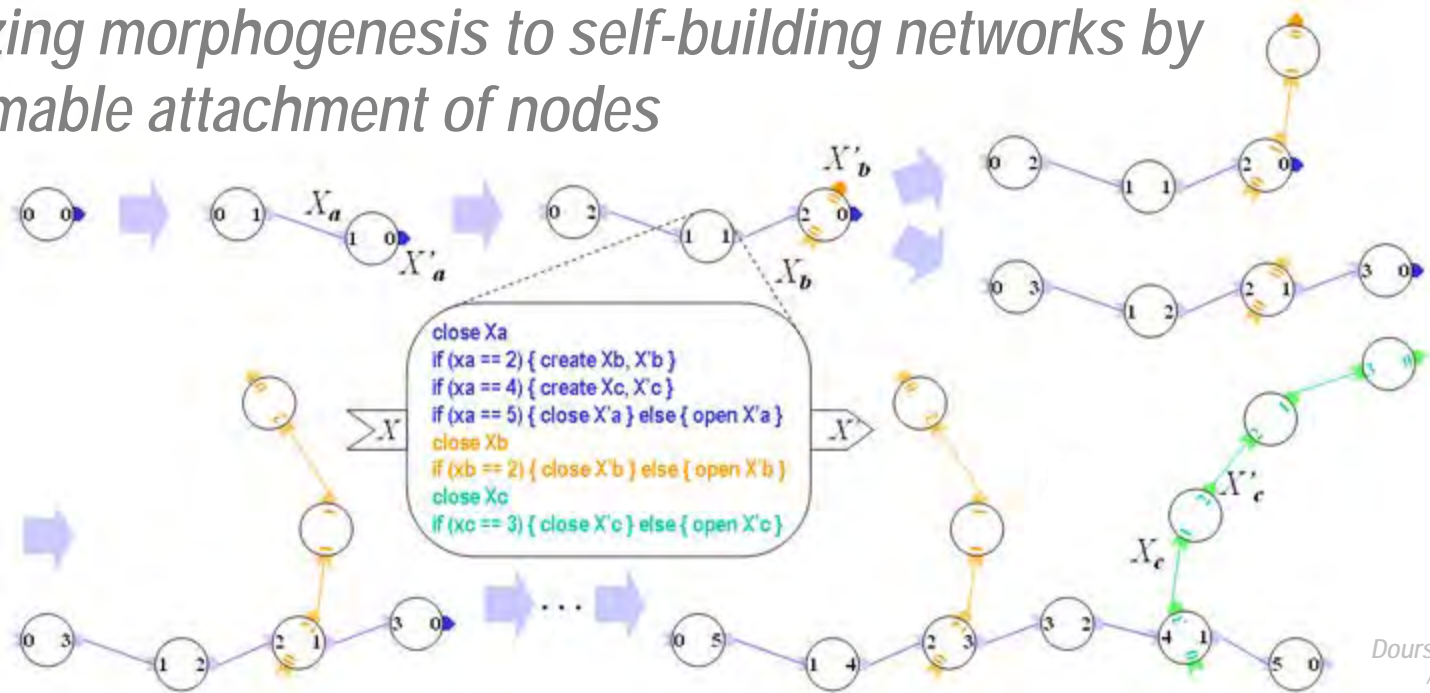
We define **socio-technical combinatorics** as the study of the potentially infinite number of discrete and reconfigurable physical, behavioural and organisational structures which characterise socio-technical systems comprising humans, sensors, and agents.

It is also the study of how these structures interact with each other and their environment – how they assemble, evolve, dis-assemble, and re-assemble, and how they can be engineered.

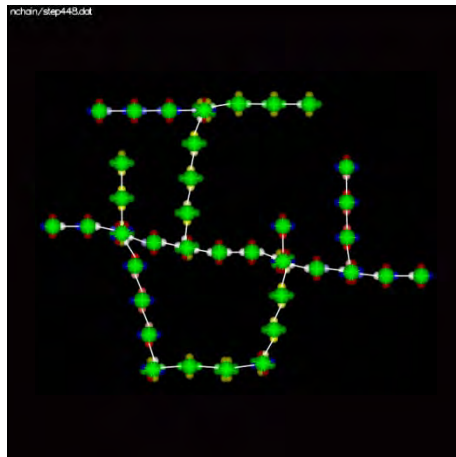
*Projet ECSTASY, 2011*

# 4. Morphogenetic Engineering: ProgNet

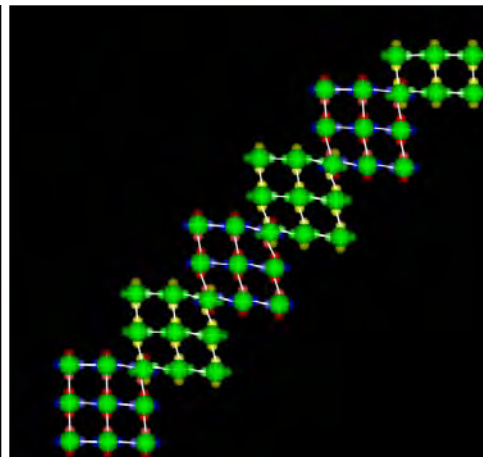
*Generalizing morphogenesis to self-building networks by programmable attachment of nodes*



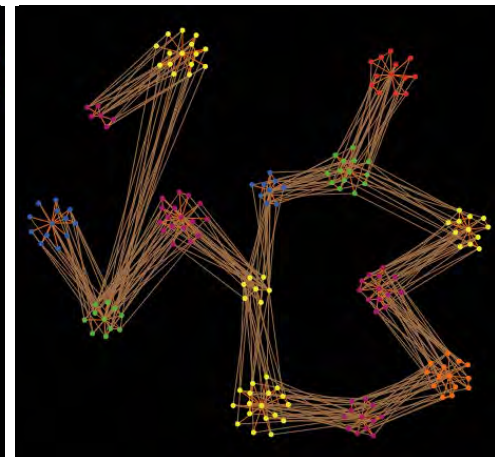
*Doursat & Ulieru (2008)  
Autonomics 2008, Turin*



single-node  
composite branching



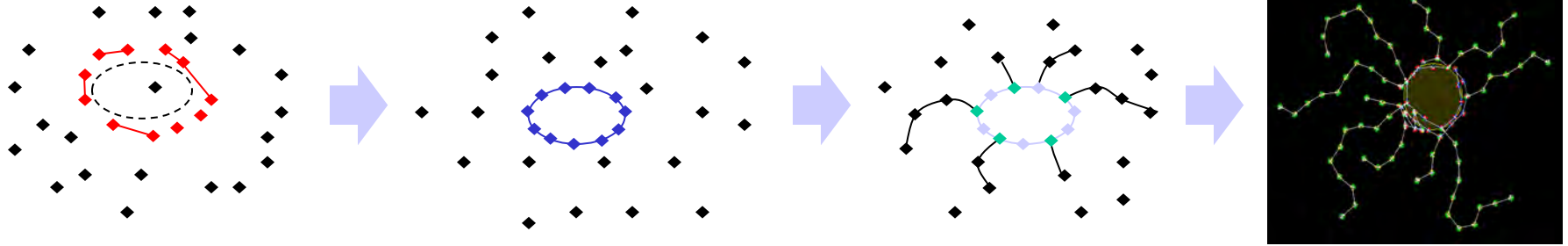
iterative lattice pile-up



clustered  
composite branching

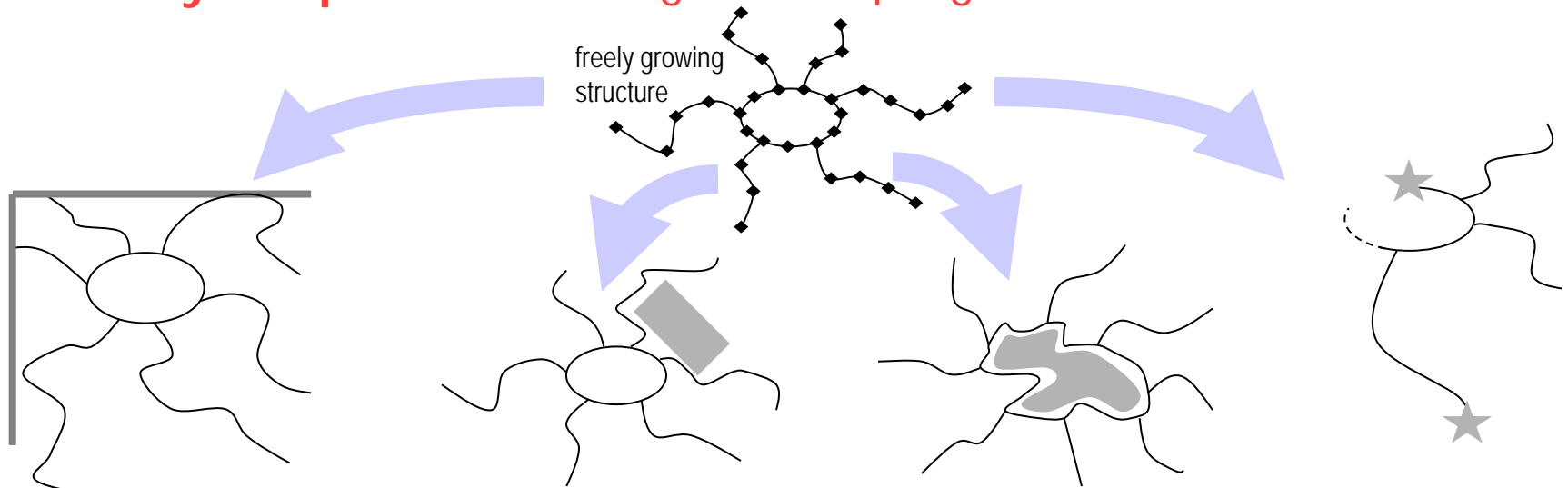


## Development: growing an intrinsic architecture

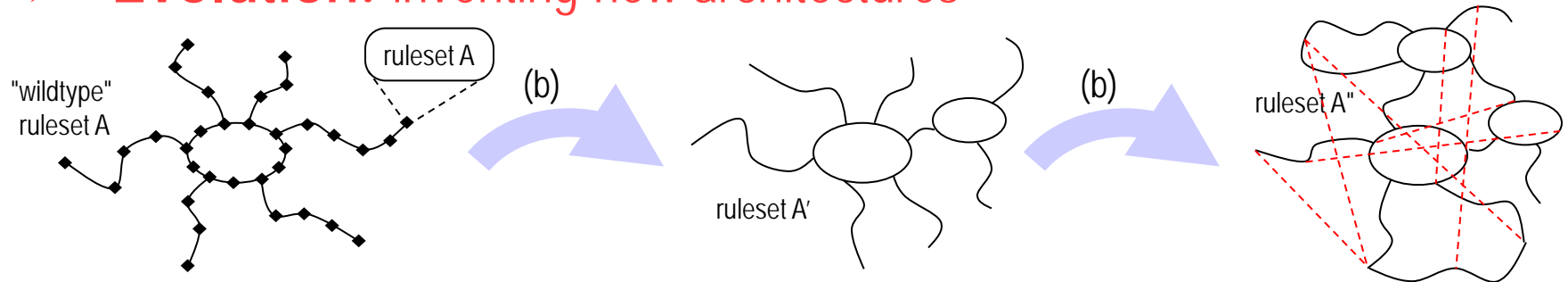


Uliuru & Doursat (2010) ACM TAAS  
simulation by Adam MacDonald, UNB

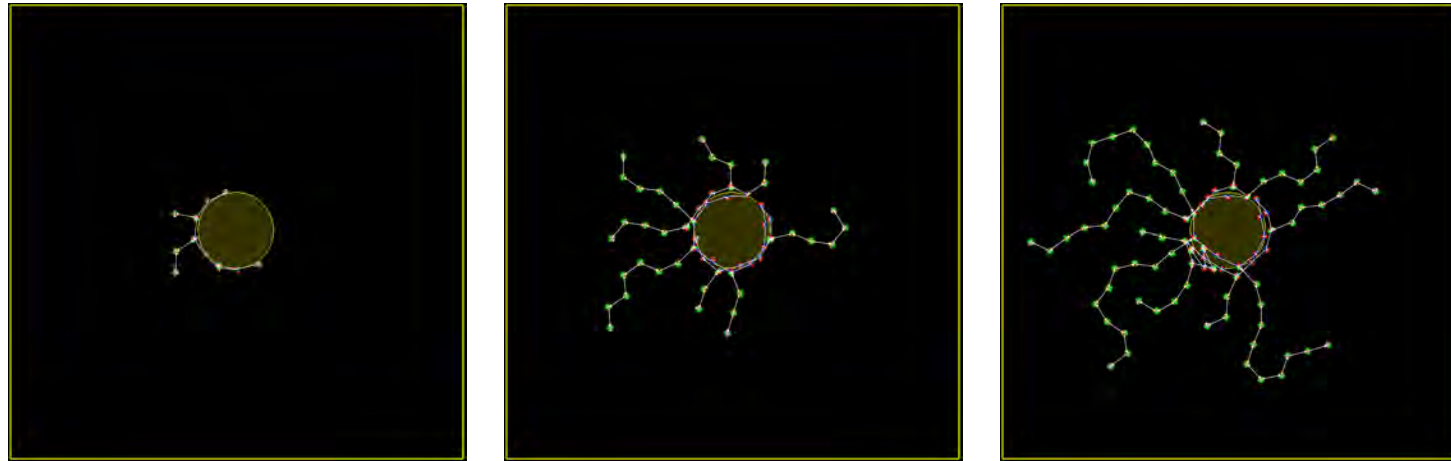
## ➤ Polymorphism: reacting and adapting to the environment



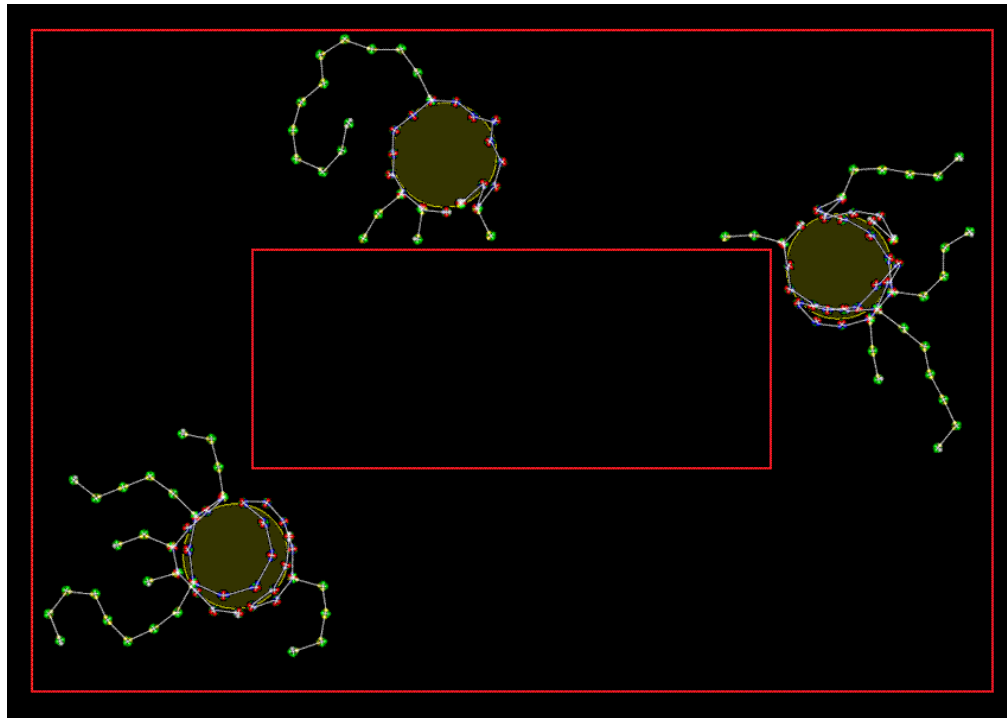
## ➤ Evolution: inventing new architectures



# 4. Morphogenetic Engineering: ProgNet



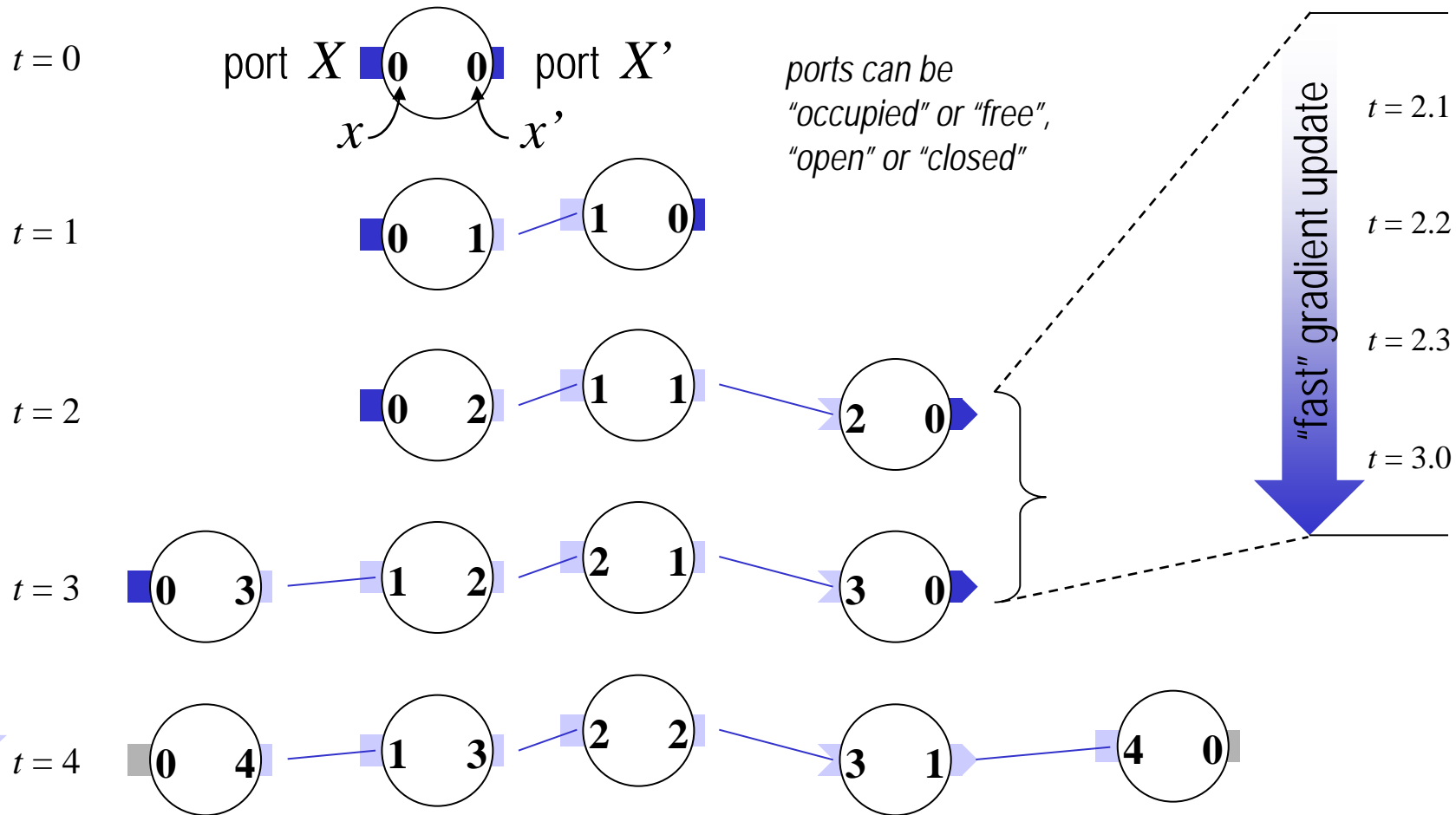
Order  
influenced (not  
imposed) by the  
environment



# 4. Morphogenetic Engineering: ProgNet

## ➤ Simple chaining

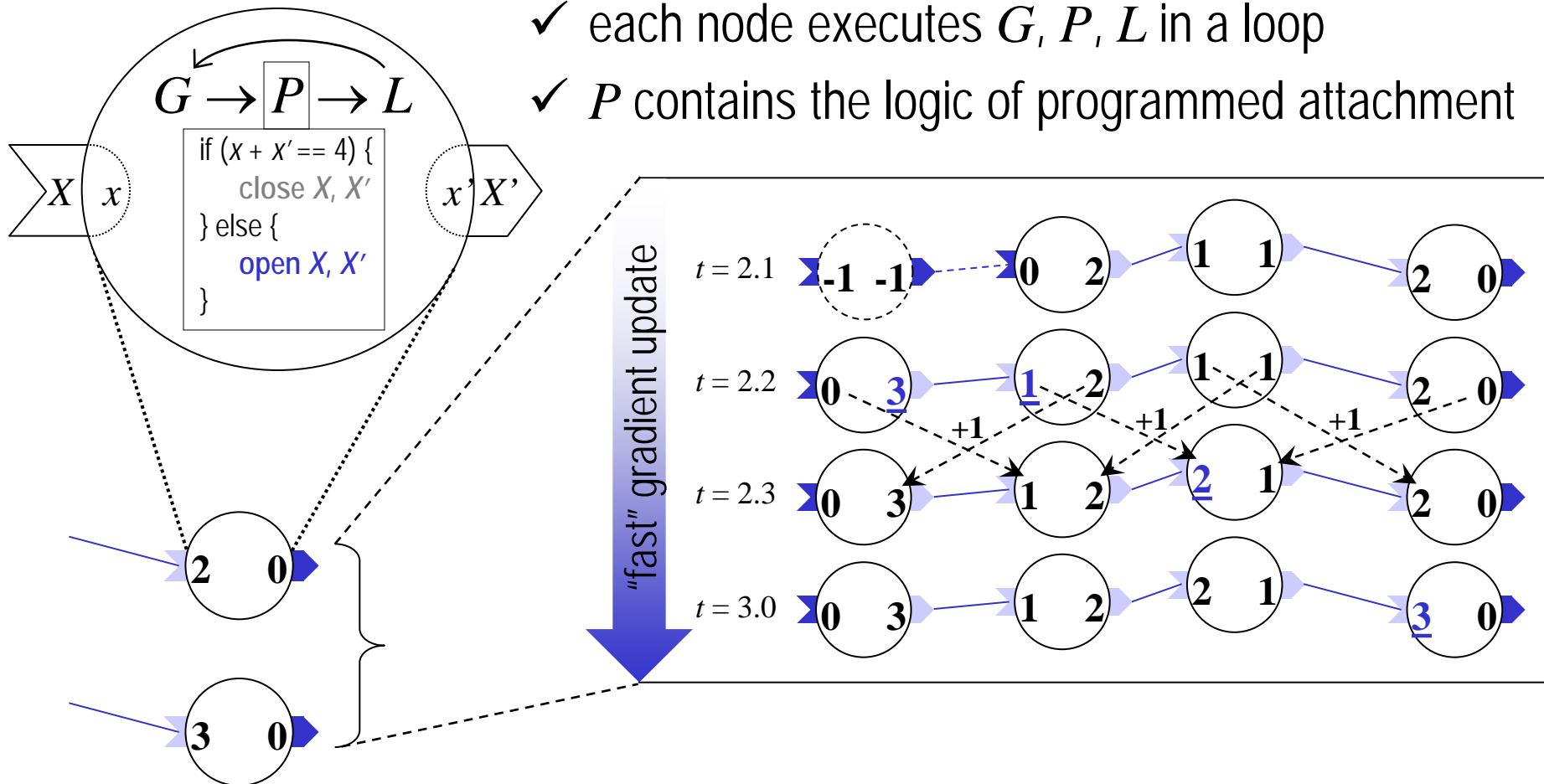
- ✓ link creation ( $L$ ) by programmed port management ( $P$ )



# 4. Morphogenetic Engineering: ProgNet

## ➤ Simple chaining

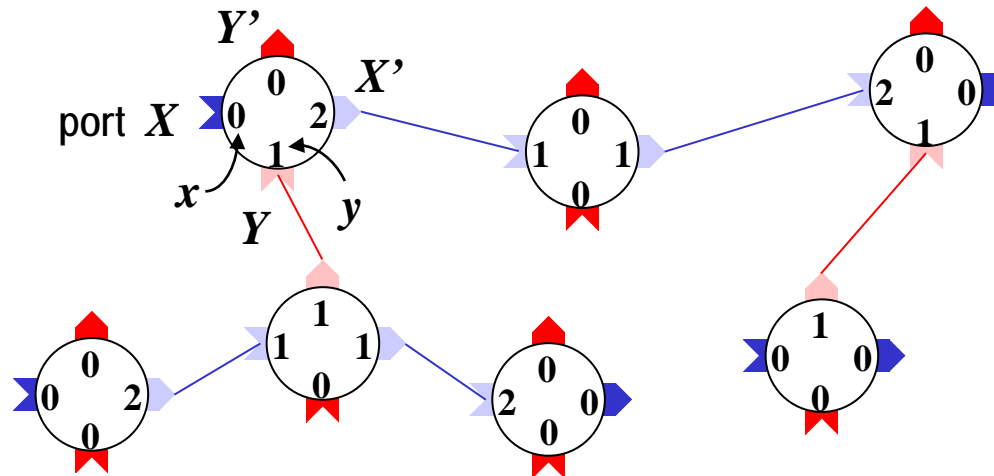
- ✓ port management ( $P$ ) relies on gradient update ( $G$ )
- ✓ each node executes  $G, P, L$  in a loop
- ✓  $P$  contains the logic of programmed attachment



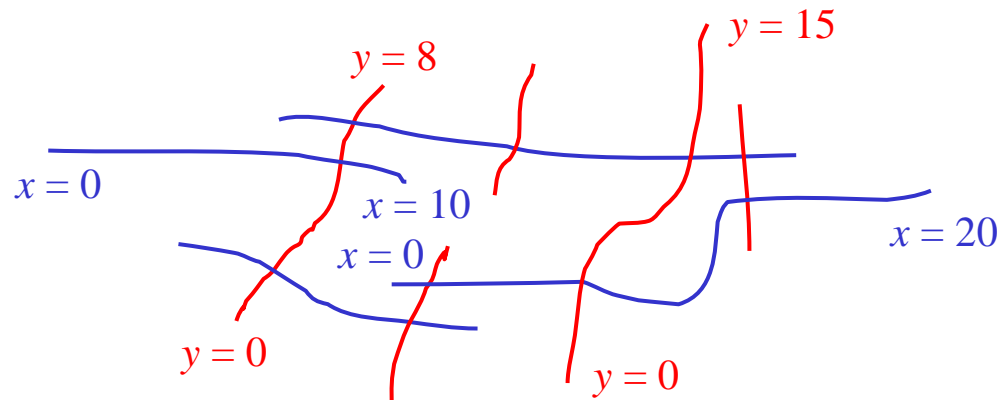
# 4. Morphogenetic Engineering: ProgNet

## ➤ Lattice formation by guided attachment

- ✓ *two pairs of ports:  $(X, X')$  and  $(Y, Y')$*



- ✓ *without port management  $P$ , chains form and intersect randomly*

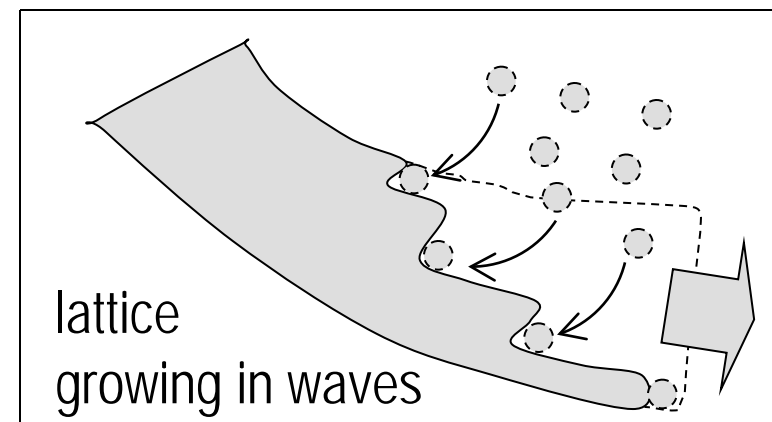
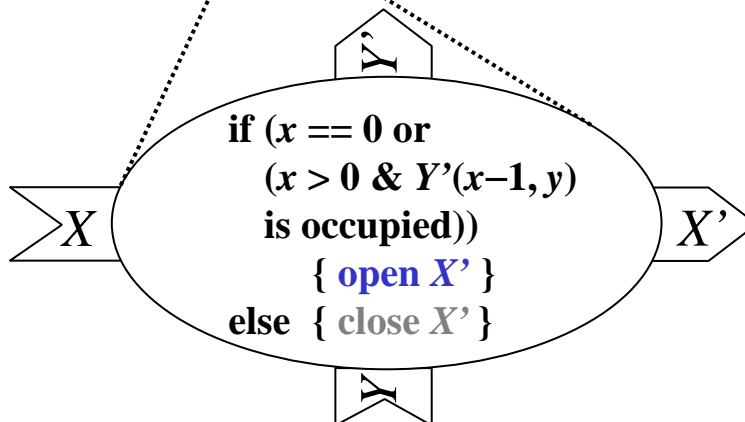
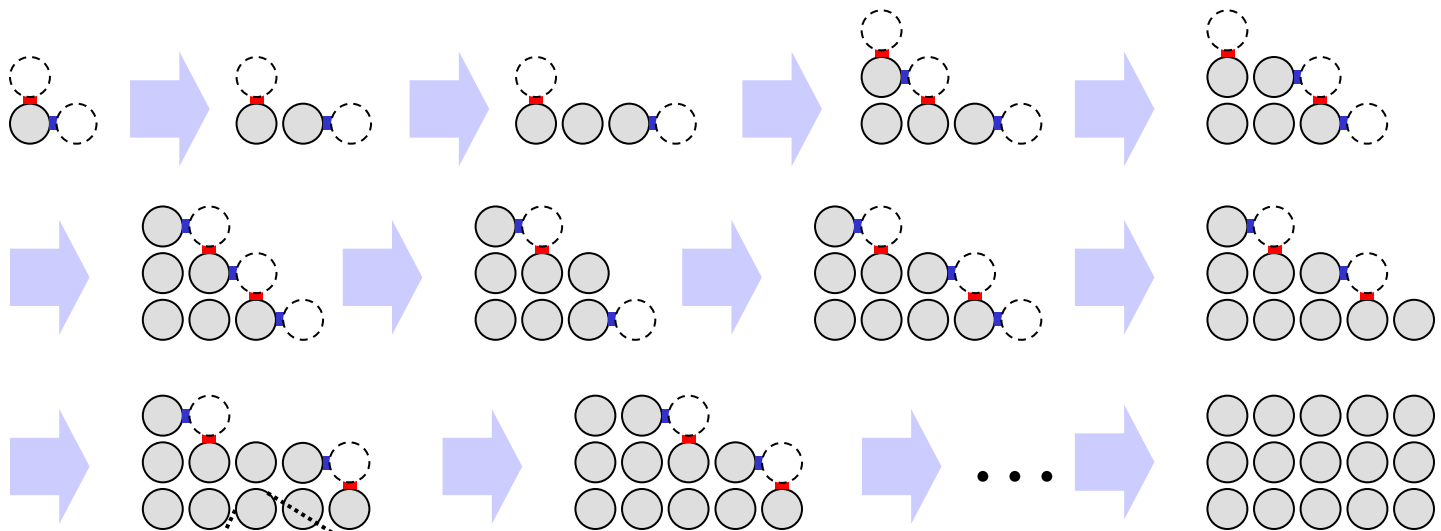




# 4. Morphogenetic Engineering: ProgNet

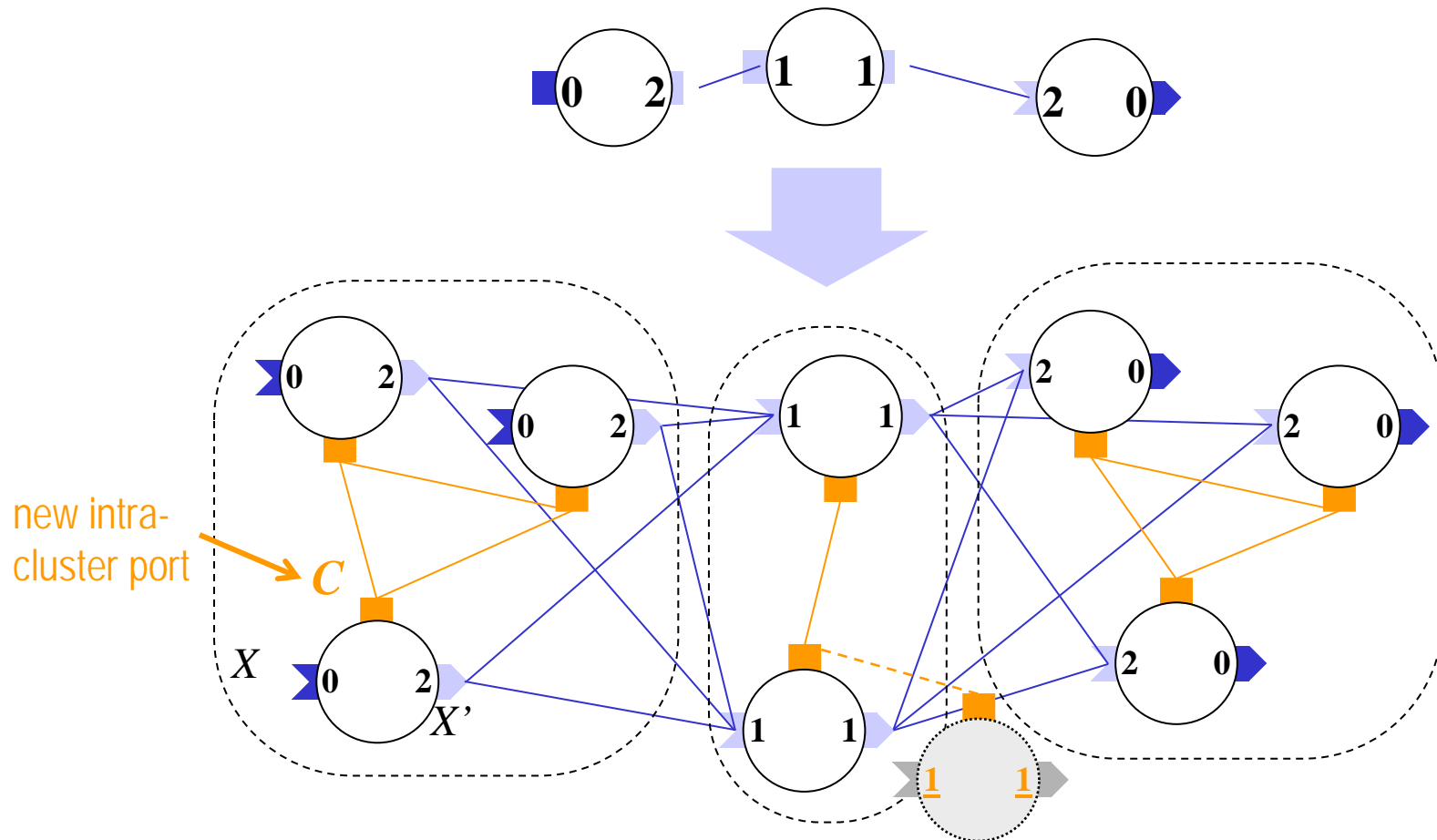
## ➤ Lattice formation by guided attachment

- ✓ only specific spots are open, similar to beacons on a landing runway



## ➤ Cluster chains and lattices

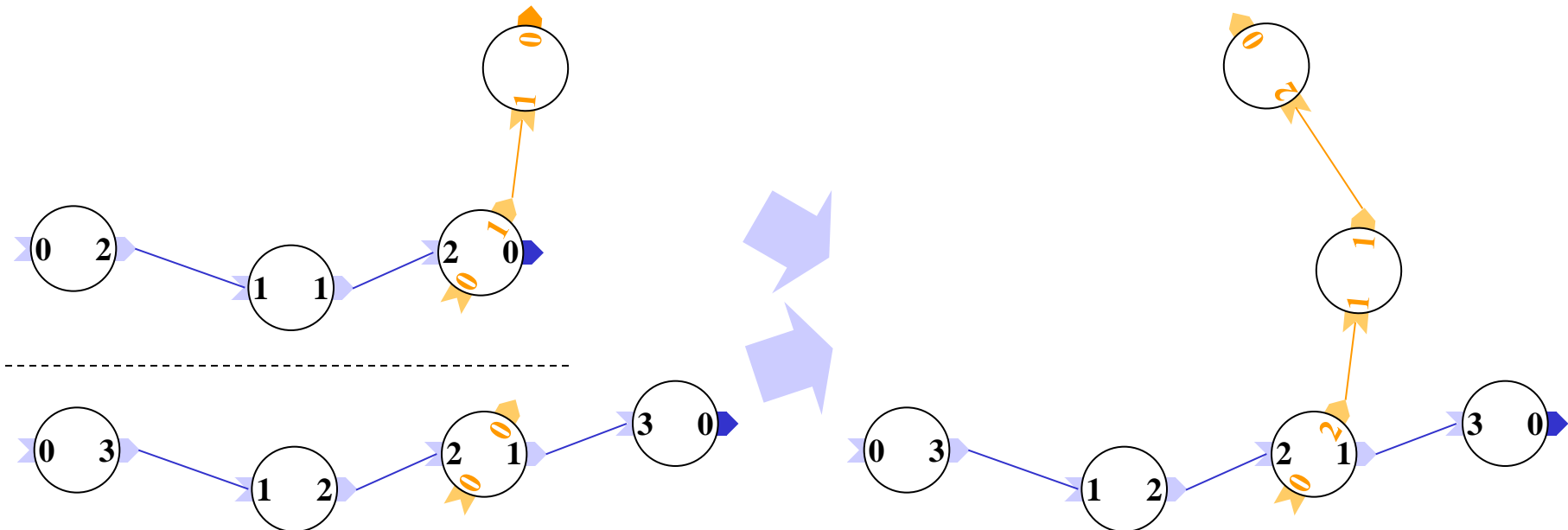
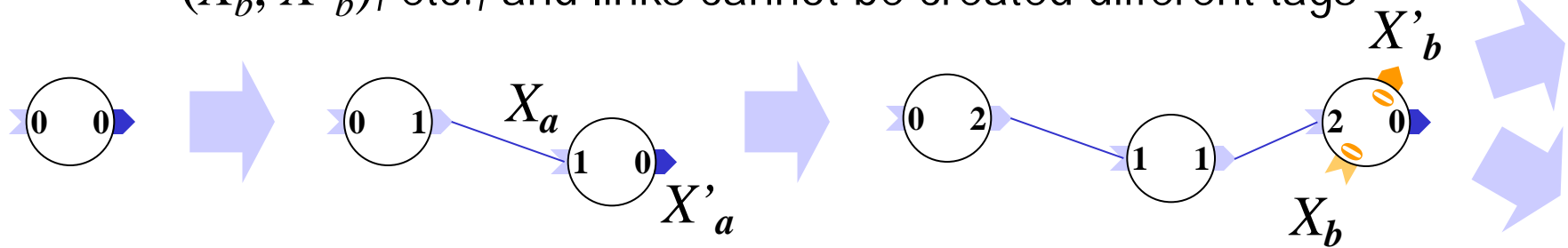
- ✓ several nodes per location: reintroducing randomness but only within the constraints of a specific structure



# 4. Morphogenetic Engineering: ProgNet

## ➤ Modular structures by local gradients

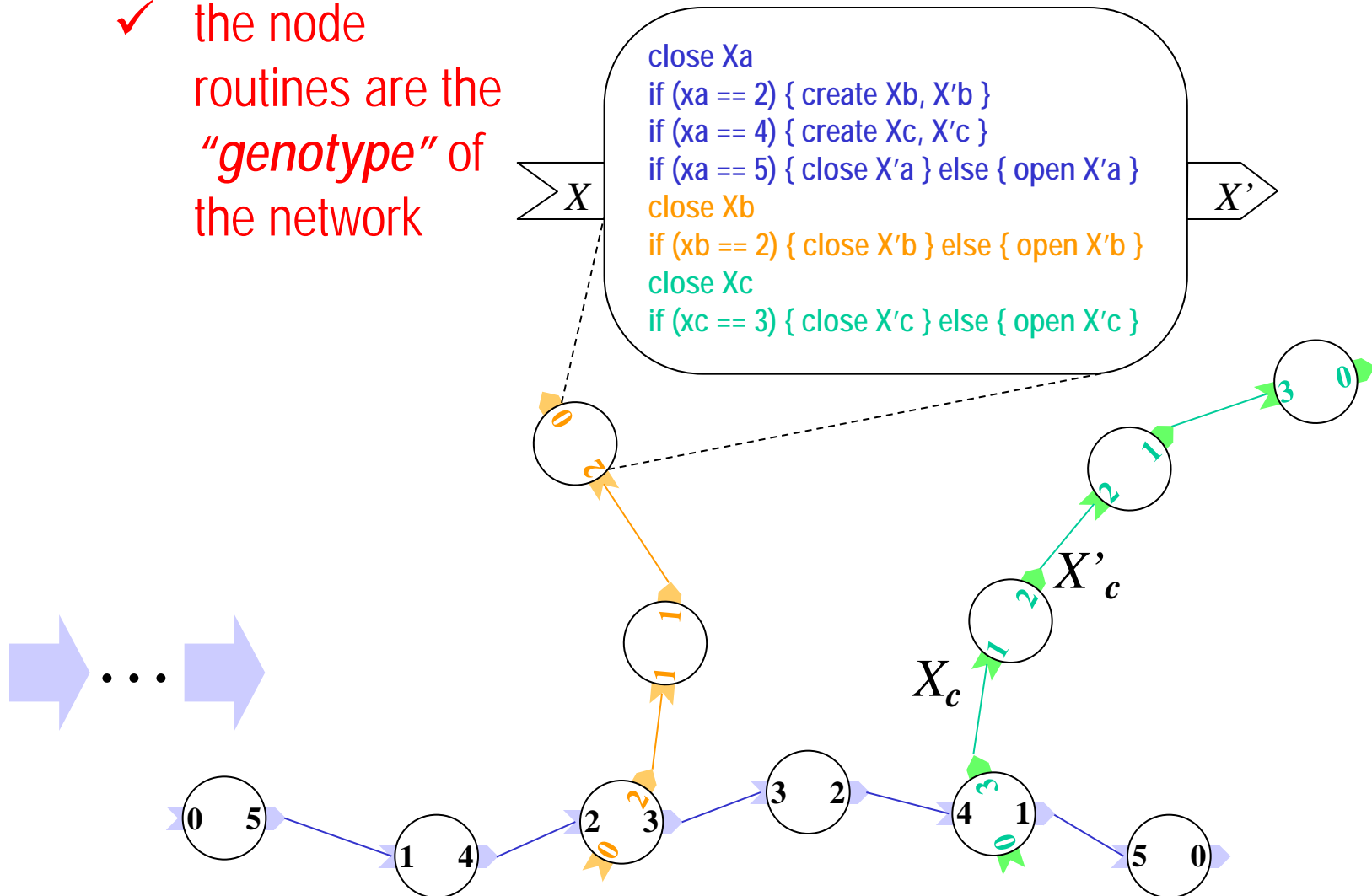
- ✓ modeled here by different coordinate systems,  $(X_a, X'_a)$ ,  $(X_b, X'_b)$ , etc., and links cannot be created different tags



# 4. Morphogenetic Engineering: ProgNet

## ➤ Modular structures by local gradients

- ✓ the node routines are the *"genotype"* of the network



## 4. Morphogenetic Engineering (ME)

Summary: ME is about programming the agents of emergence

### a) Giving agents self-identifying and self-positioning abilities

- ✓ agents possess the same set of rules but execute different subsets depending on their position = "differentiation" in cells, "stigmergy" in insects

### b) ME brings a new focus on "complex systems engineering"

- ✓ exploring the artificial design and implementation of autonomous systems capable of developing sophisticated, heterogeneous morphologies or architectures without central planning or external lead

### c) Related *emerging ICT disciplines* and application domains

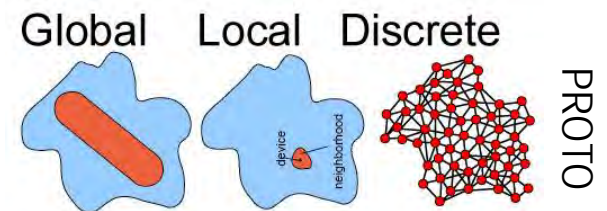
- |                                            |                                 |
|--------------------------------------------|---------------------------------|
| ✓ <i>amorphous/spatial computing</i> (MIT) | ✓ swarm robotics,               |
| ✓ <i>organic computing</i> (DFG, Germany)  | modular/reconfigurable robotics |
| ✓ <i>pervasive adaptation</i> (FET, EU)    | ✓ mobile ad hoc networks,       |
| ✓ <i>ubiquitous computing</i> (PARC)       | sensor-actuator networks        |
| ✓ <i>programmable matter</i> (CMU)         | ✓ synthetic biology, etc.       |



# 4. Morphogenetic Engineering (ME)

Summary: ME is about programming the agents of emergence

- ✓ an original, young field of investigation without a strong theoretical framework yet – but close links with many established disciplines, which can give it a more formal structure through their own tools
  - cellular automata, pattern formation
  - collective motion, swarm intelligence (Ant Colony Optim. [Dorigo])
  - gene regulatory networks: coupled dynamical systems, attractors
  - spatial computing languages:
    - PROTO [Beal] and MGS [Giavitto]
    - (top-down compilation)
  - evolution: genetic algorithms, computational evolution [Banzhaf]
  - Iterative Function Systems (IFS) [Lutton]



→ *goal: going beyond agent-based experiments and find an abstract description on a macroscopic level, for better control and proof*

## 4. Morphogenetic Engineering (ME)

1<sup>st</sup> “Morphogenetic Engineering” Workshop, ISC, Paris 2009

<http://iscpif.fr/MEW2009>

2<sup>nd</sup> “Morphogenetic Engineering” Session, ANTS 2010, Brussels

<http://iridia.ulb.ac.be/ants2010>

3<sup>rd</sup> “Morphogenetic Engineering” Workshop, ECAL 2011, Paris

<http://ecal11.org/workshops#mew>

“Morphogenetic Engineering” Book, 2011, Springer

*R. Doursat, H. Sayama & O. Michel, eds.*

# COMPLEX SYSTEMS & COMPUTATION

## 1. What are Complex Systems?

- Decentralization
- Emergence
- Self-organization

## 2. Architects Overtaken by their Architecture

Designed systems that became suddenly complex

## 3. Architecture Without Architects

Self-organized systems that *look* like they were designed  
but were not

## 4. Morphogenetic Engineering

From cells and insects to robots and networks

## 5. A New World of CS Computation

Or how to exploit and organize spontaneity

20<sup>th</sup>11<sup>th</sup> ECAL, Paris 201120<sup>th</sup> Anniversary Edition: “Back to the Origins of Alife”

Cité Universitaire Internationale, Paris, August 8-12, 2011

11<sup>th</sup>**Organizing committee:** Hugues Bersini, Paul Bourguine, René Doursat (chairs) – Tom Lenaerts, Mario Giacobini, Marco Dorigo**Overview and Spirit**

- **Refocusing on complex biological systems**
  - o first ECAL conferences centered on theoretical biology and the physics of complex systems
  - o today, Alife can take more inspiration from new developments at the intersection between computer science and complex biological systems
- **Expanding the topics of Alife**
  - o multiscale pattern-forming morphodynamics
  - o autopoiesis & robustness
  - o capacity to self-repair
  - o cognitive capacities
  - o co-adaptation at all levels, including ecology
  - o etc.

**Keynote Speakers (tentative)**

- Eric Wieschaus: Nobel Prize in Physiology 1995
- Jean-Marie Lehn: Nobel Prize in Physics 1987
- Robert Laughlin: Nobel Prize in Physics 1998
- Jacques Demongeot: a pioneer of mathematical biology
- David Harel: UML co-inventor, *C. Elegans* computer model
- James D. Murray: FRS, *Mathematical Biology* book
- Jordan Pollack: Alife pioneer, co-founder of Evo Robotics
- Ricard Solé: theoretical biologist, complex systems
- Pier Luigi Lisi: synthetic biology

**A tribute to Francisco Varela**