

# BIO-INSPIRED COMPUTING:

## Achievements and Dreams

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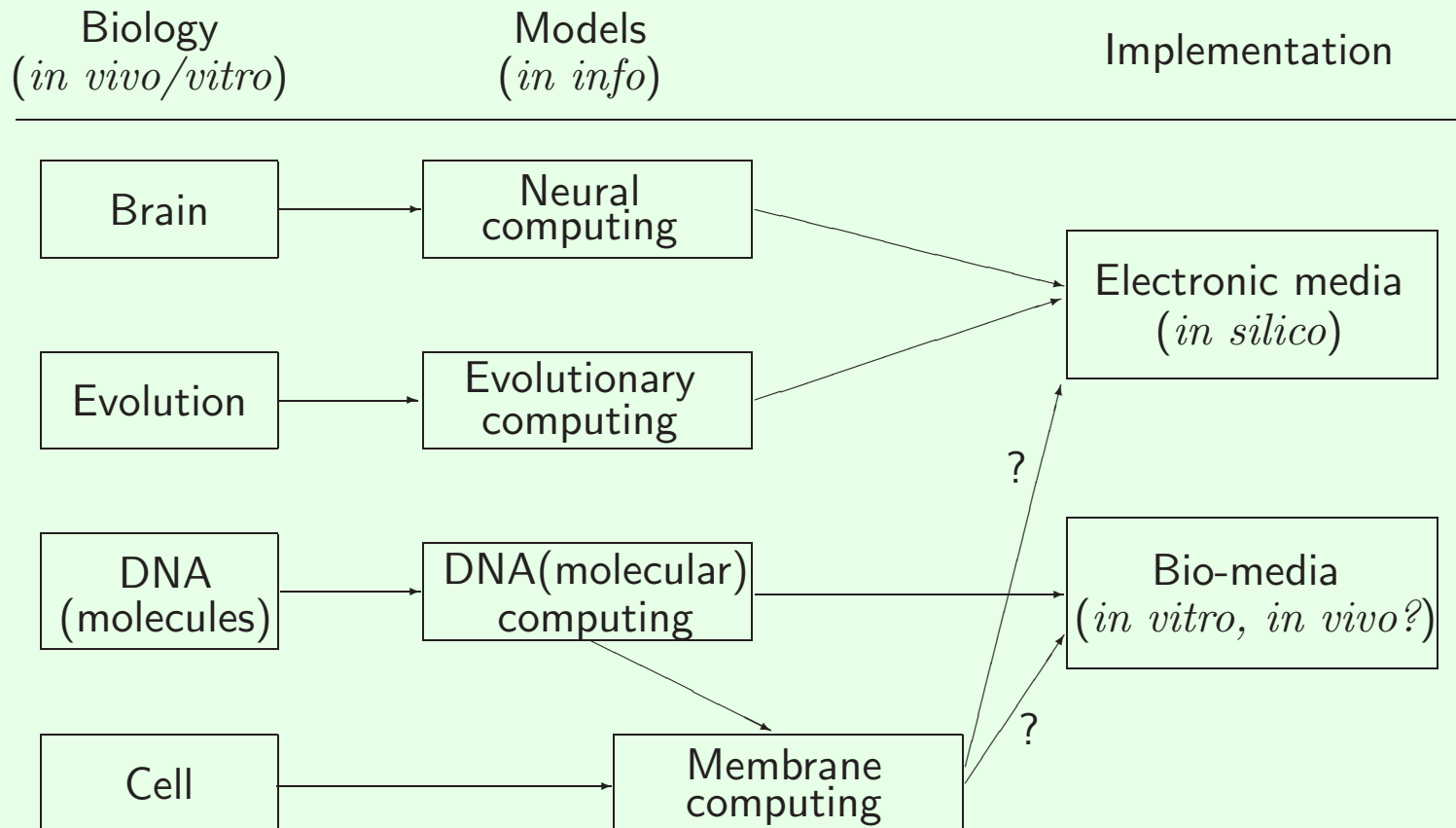
[curteadelaarges@gmail.com](mailto:curteadelaarges@gmail.com)

<http://ppage.psystems.eu>

## Summary:

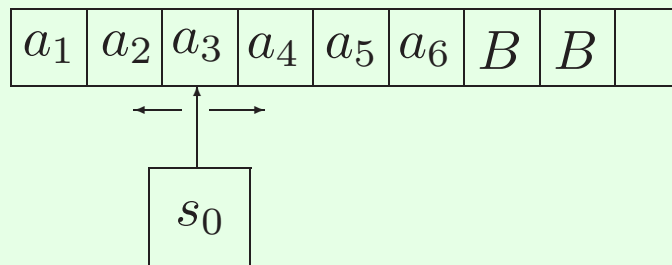
- generalities about natural computing
  1. what is a computation?
  2. does nature compute?
  3. why natural computing? (or, the limits of current computers)
  4. “everything” goes back to Turing
  5. a (simulated) wondering: why GA are so good?
  6. what means to compute “in a natural way”?
- DNA computing:
  1. history (old times, T. Head, L. Adleman)
  2. the marvelous DNA molecule
  3. computing by splicing
  4. DNA computing today
- membrane computing:
  1. the general idea
  2. (types of) results
  3. (types of) applications
- at the edge of science-fiction
- do we dream too much?

## (Basic)Bio-inspired areas of natural computing



## What is a computation?

Here (math.): Turing computability (input–output, algorithm, universal TM)



If “computation = information processing”, then “everything is a computation”.

Does a falling drop of water solves differential equations?

Ciliates: list processing before McCarthy...

**Computation = a process which is considered computation by an observer**

T. Toffoli: Nothing makes sense in computing except in the light of evolution. *Int. J. of Unconventional Computing*, 1 (2005), 3–29.

It is not useful to call ‘computation’ just any nontrivial yet somewhat disciplined coupling between state variables. We also want this coupling to have been *intentionally* set up for the purpose of predicting or manipulating – in other words, for *knowing* or *doing* something. (...) *The concept of computation must emerge as a natural, well-characterized, objective construct, recognizable by and useful to humans, Martians and robots alike”* (my emphasis, Gh.P.).

## Does nature computes?

Here, nature = bio-entities, excluding *homo sapiens* (and Martians...)

YES/NO, depending on the definition – see above

My position: the goal of life is living, not computing (but we can use ideas, data structures, operations, architectures, strategies, paradigms, materials, etc. from biology for computing – improving the existing computers or imagining new ones).

## The limits of current computers

Complexity (tractable/**P** versus intractable/**NP**), information storage capacity, energy efficiency, adaptability/learnability, robustness/self-healing, etc.

### Beware of exponentials...:

problem  $Q$  of complexity  $3^n$ , computer today solving  $Q(100)$ , computer 1000 times faster  $\implies$  solving (in the same time)  $Q(106)$

**P**  $\neq$  **NP** is the first Millennium Prize Problem of Clay Mathematics Institute ([www.claymath.org](http://www.claymath.org))

...and, of course, the computer does not play GO/weichi

## Why natural computing?

1. limits of Turing – von Neumann paradigm
2. limits of silicon (Moore law, communication complexity)
3. adaptation, learning, self-healing, robustness, nondeterminism, etc.
4. energy efficiency
5. mathematical/computability challenge  
(what means to compute *in a natural way*?)
6. by-products (biology, medicine)
7. why not?



“Everything” goes back to Turing: <http://www.AlanTuring.net>

Turing Machine = abstraction of what a bank clerk is doing when computing

A. Turing: *Intelligent machinery*, 1948 (published in 1968: sir Charles Darwin considered it a “schoolboy essay” ...) – (randomly connected) nets of neurons, hence neural computing

Also in 1948: “genetical or evolutionary search”, hence evolutionary computing (later, Holland, Bremermann, Fogel, Owens, Walsh – in sixties, Koza, etc., etc.).

Turing also imagined ways to “compute beyond Turing” (hypermachines, oracles) – PhD thesis, Princeton, 1938 (and still, “forgotten” ...)

## Why genetic algorithms are so good?

“When you do not know the right direction, walk randomly” ...  
(random here = crossovering, mutation, selection, etc.)

“Bio-mystical” answer: because life has used and improved the respective ingredients for billions of years

Optimistic consequence for all branches of natural computing

## What means to compute “in a natural way”?

Which data structures (strings? DNA-like double sequences? multisets?), which operations (local rewriting? splicing? multiset processing?), which types of devices (sequential? parallel? synchronous/asynchronous? distributed? halting?), etc., etc.

Interesting mathematical problems (e.g., are Turing, Chomsky, Lindenmayer, etc. levels of computability *natural*? can computability be reconstructed on other bases?)

## DNA computing



- Bennett, Conrad, etc.
- T. Head (1987) – splicing
- L. Adleman (1994) – solving HPP in a lab
- E. Winfree – self-assembly (Wang Hao tiles)
- coding, nano-technology, scaling-up, errors

## Intrinsic computational universality – via twin-shuffle languages:

$V, \bar{V}, \bar{x}, \sqcup$

$$TS_V = \bigcup_{x \in V^*} (x \sqcup \bar{x})$$

Theorem [Engelfriet, Rozenberg 80]:  $L \in RE, L \subseteq T^*, L = pr_T(TS_V \cap R)$

Corollary:  $L \in RE, L = gsm_L(TS_{\{0,1\}})$

	upper strand	lower strand
A, T	0	$\bar{0}$
C, G	1	$\bar{1}$

$\implies \text{DNA} \approx TS_{\{0,1\}}$

**Bidirectionality?** – no problem: reverse twin-shuffle:

$$RTS_V = \bigcup_{x \in V^*} (x \sqcup mi(\bar{x}))$$

Theorem [Engelfriet 96]:  $L \in RE, L \subseteq T^*, L = pr_T(RTS_V \cap R)$

Corollary:  $L \in RE, L = gsm_L(RTS_{\{0,1\}})$

All nucleotides necessary? – not: (reverse) semi-twin-shuffle

complementarity :  $c(0) = \bar{0}$ ,  $c(1) = 1$

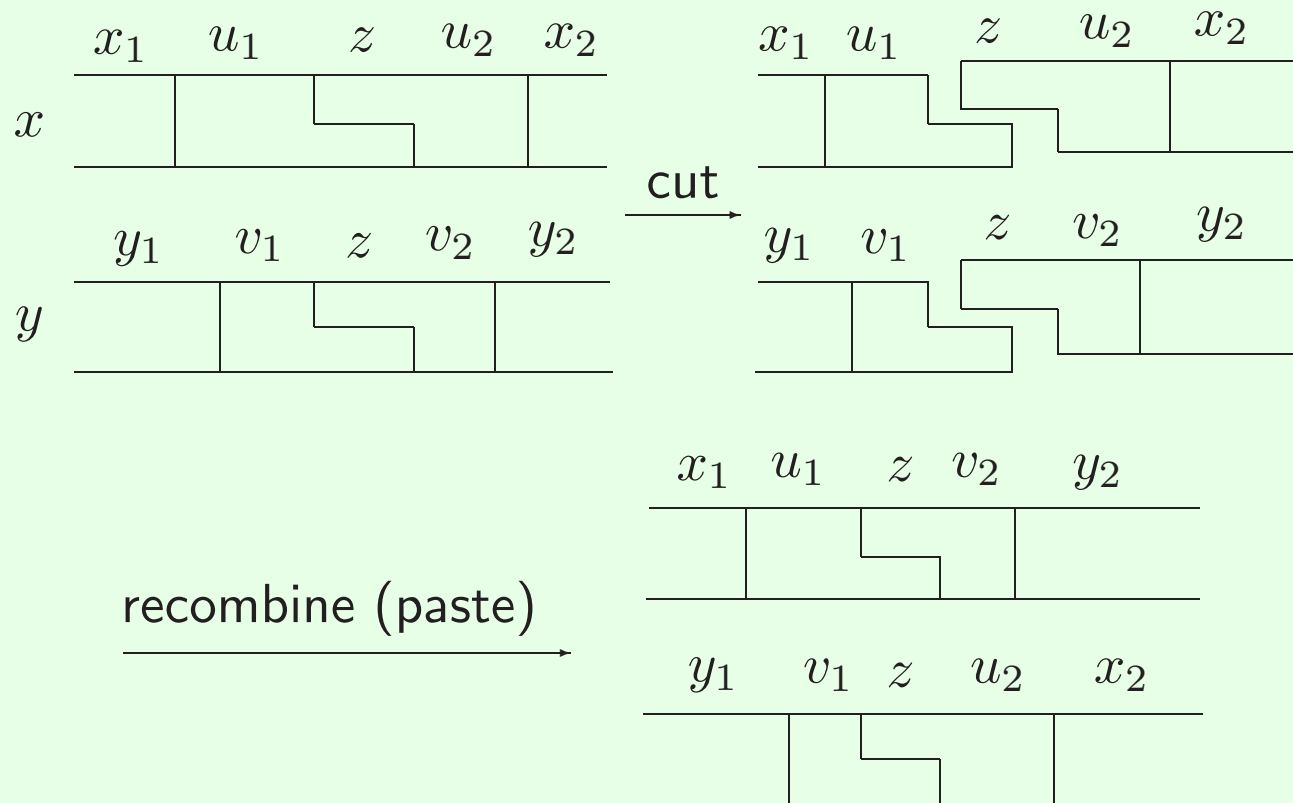
$$STS_V = \bigcup_{x \in V^*} (x \sqcup c(x))$$

$$RSTS_V = \bigcup_{x \in V^*} (x \sqcup mi(c(x)))$$

Theorem [DNA book]:  $L \in RE, L = gsm_L([R]STS_{\{0,1\}})$

Gh. Păun, G. Rozenberg, A. Salomaa,  
DNA Computing. New Computing Paradigms,  
Springer 1998; Tokyo 1999; Tsinghua Univ. Press, Beijing, 2004; Mir, Moscow,  
2005

# Computing by splicing





Splicing rule (over  $V$ ,  $\# \notin V$ ):  $r = u_1\#u_2\$v_1\#v_2$

Operation:

$$(x, y) \vdash_r (w, z) \quad \text{iff} \quad \begin{aligned} x &= x_1u_1u_2x_2, \quad y = y_1v_1v_2y_2, \\ w &= x_1u_1uv_2y_2, \quad z = y_1v_1u_2x_2, \quad x_1, x_2, y_1, y_2 \in V^*. \end{aligned}$$

Splicing system/H system:  $\gamma = (V, T, A, R)$

Language generated:  $L(\gamma) = \{x \in T^* \mid A \Longrightarrow_{\text{iterated splicing}} x\}$

[Culik II, Harju, 1991], [Pixton 1995], [Manca 2000] Only regular languages

Universality, using controls, distribution (membranes!) [Păun, 1995, 96, 97...]  
(not very realistic...)

DNA computing today:

- no significant computability application reported (cryptography?), but
- important mathematical developments
- nano-technology
- medicine (speculations: curing robots)
- computing in vivo (ciliates)

Difficulties: trading space for time (Hartmanis), coping with errors (nondeterminism)

# Membrane computing

Goal: abstracting computing models/ideas from the structure and functioning of living cells (and from their organization in tissues, organs, organisms)

hence not producing models for biologists (although, this is now a tendency)

result:

- distributed, parallel computing model
- compartmentalization by means of membranes
- basic data structure: multisets (but also strings; recently, numerical variables)

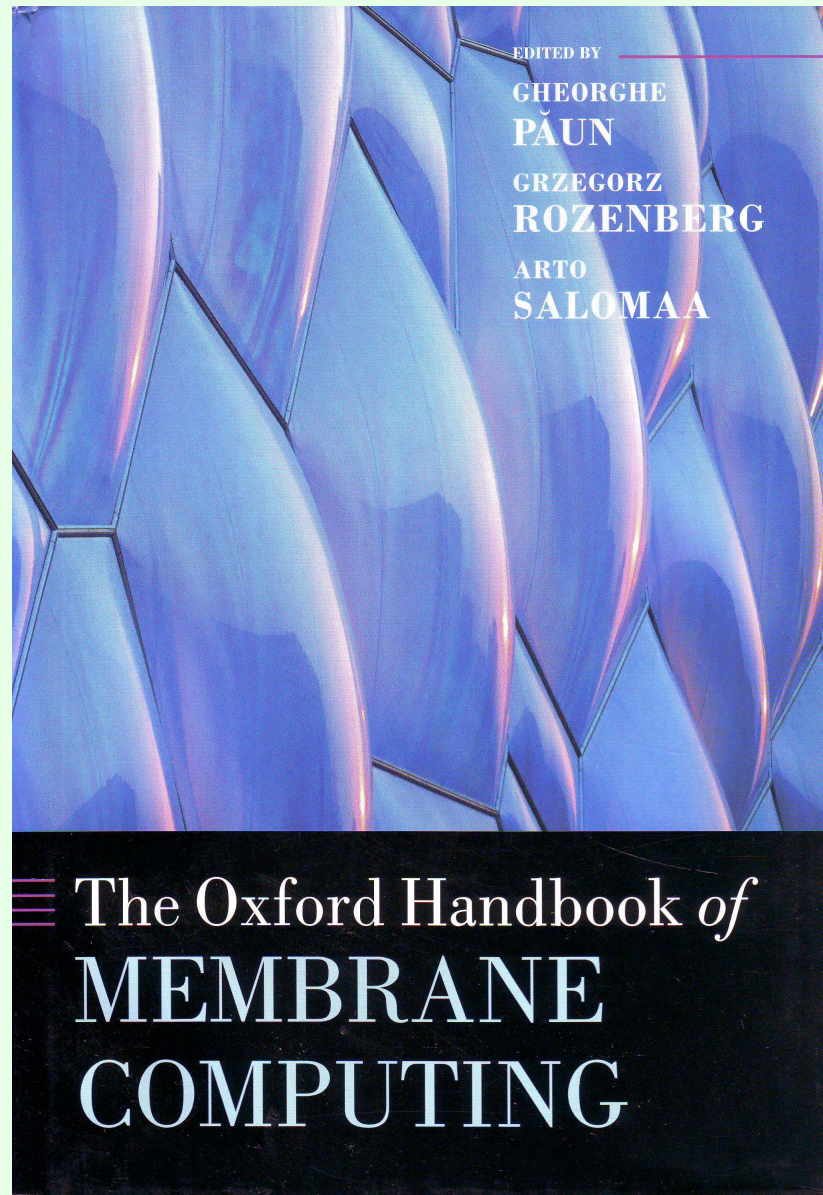
## WHY?

- the cell exists! (challenge for mathematics)
- biology needs new models (discrete, algorithmic; system biology, the whole cell modelling/simulating)
- computer science can learn (e.g., parallelism, coordination, data structure, architecture, operations, strategies)
- computing in vitro/in vivo (“the cell is the smallest computer”)
- distributed extension of molecular computing
- a posteriori: power, efficiency (“solving” NP-complete problems)
- a posteriori: applications in biology, computer graphics, linguistics, economics, etc.
- nice mathematical/computer science problems

## References:

- Gh. Păun, Computing with Membranes. *Journal of Computer and System Sciences*, 61, 1 (2000), 108–143, and *Turku Center for Computer Science-TUCS Report No 208*, 1998 ([www.tucs.fi](http://www.tucs.fi))  
ISI: “fast breaking paper”, “emerging research front in CS” (2003)  
<http://esi-topics.com>
- Gh. Păun, *Membrane Computing. An Introduction*, Springer, 2002
- G. Ciobanu, Gh. Păun, M.J. Pérez-Jiménez, eds., *Applications of Membrane Computing*, Springer, 2006
- Gh. Păun, G. Rozenberg, A. Salomaa, eds., *The Oxford Handbook of Membrane Computing*, 2010
- Website: <http://ppage.psyste.ms.eu>

(Yearly events: BWMC (February), WMC (summer), TAPS/WAPS (fall))



## SOFTWARE AND APPLICATIONS:

<http://ppage.psystems.eu>

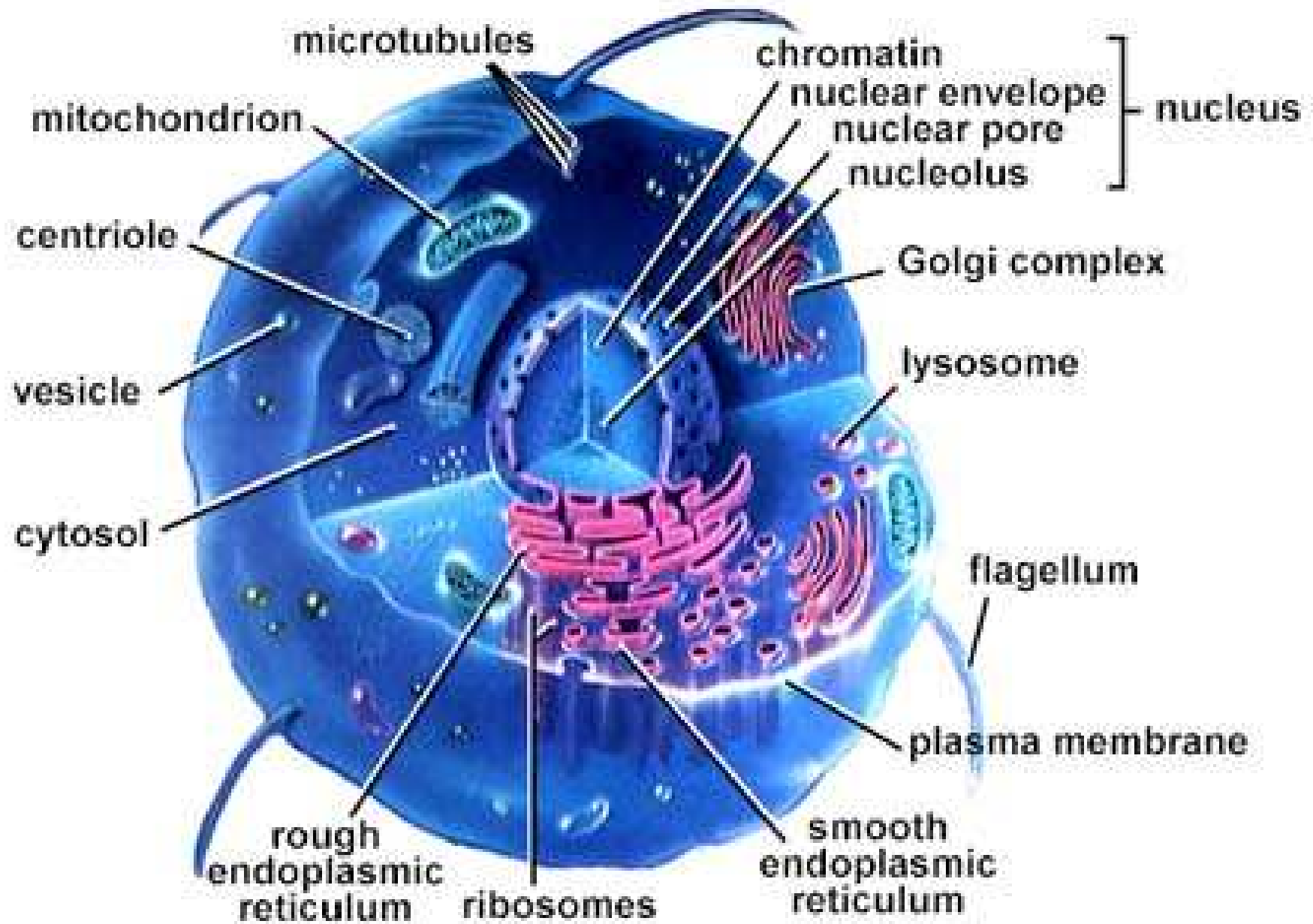
Verona (Vincenzo Manca: [vincenzo.manca@univr.it](mailto:vincenzo.manca@univr.it))

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Milano (Giancarlo Mauri: [mauri@disco.unimib.it](mailto:mauri@disco.unimib.it))

Nottingham, Trento, Nagoya, Leiden, Vienna, Evry, Iași, Madrid





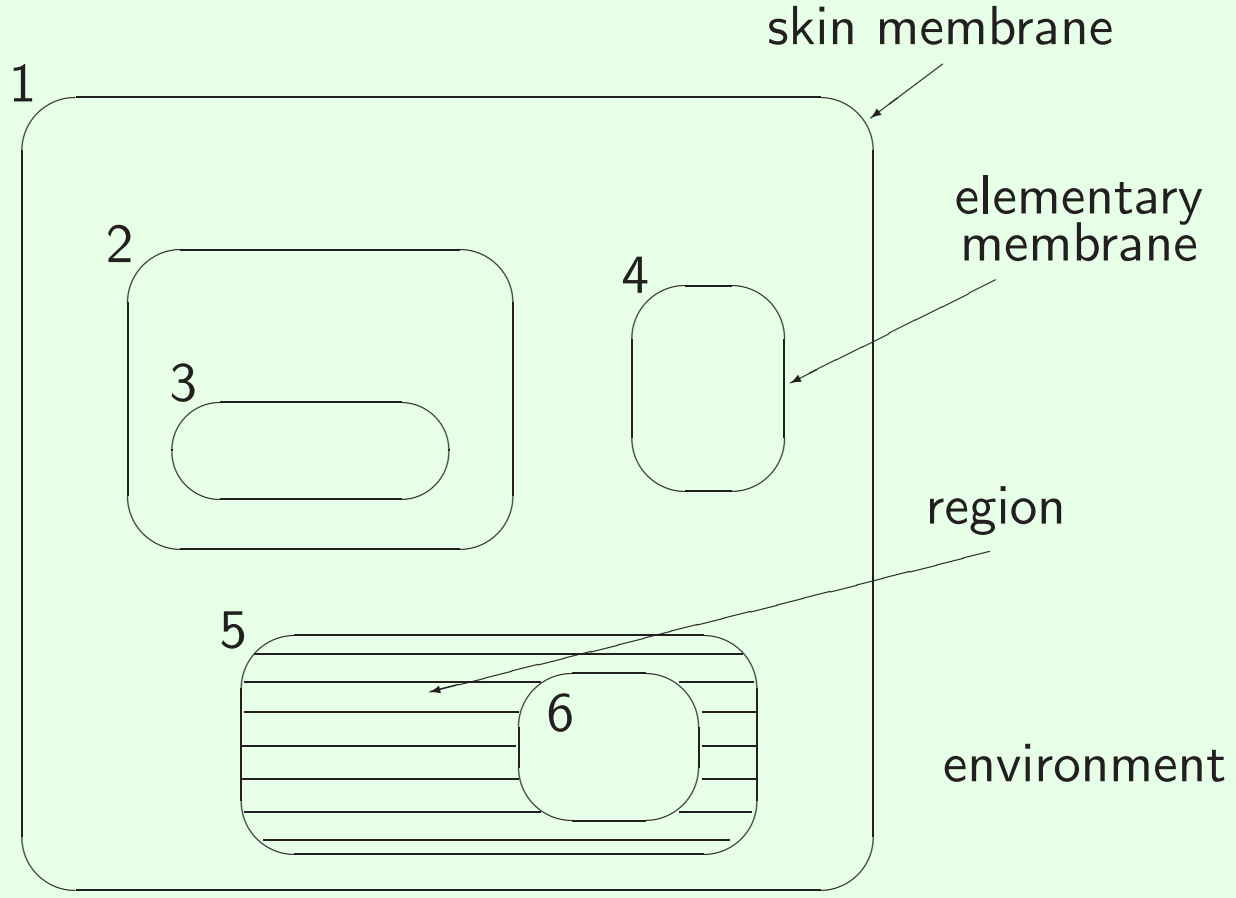
## WHAT IS A CELL? (for a mathematician)

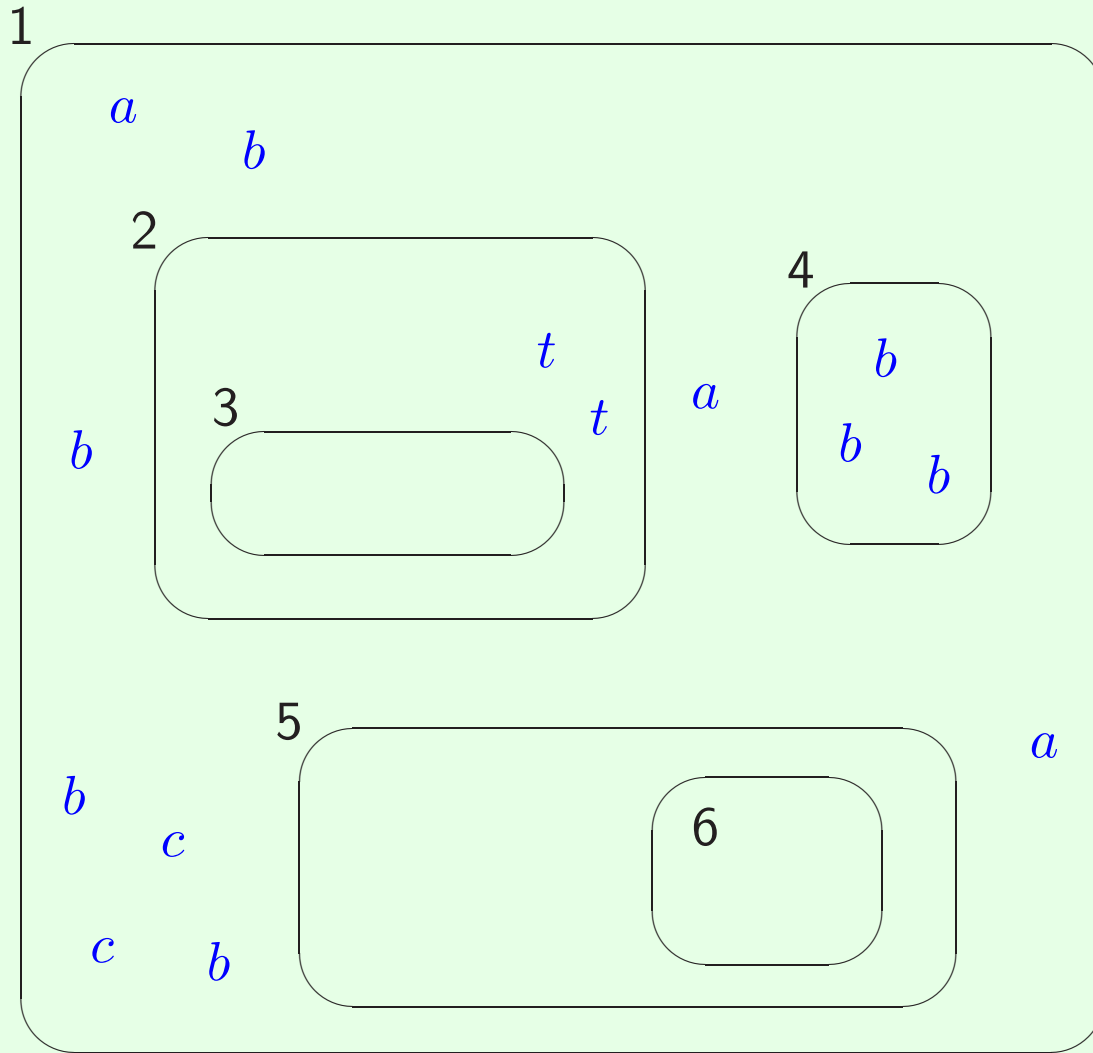
- membranes, separating “inside” from “outside” (hence protected compartments, “reactors”)
- chemicals in solution (hence multisets)
- biochemistry (hence parallelism, nondeterminism, decentralization)
- enzymatic activity/control
- selective passage of chemicals across membranes
- etc.

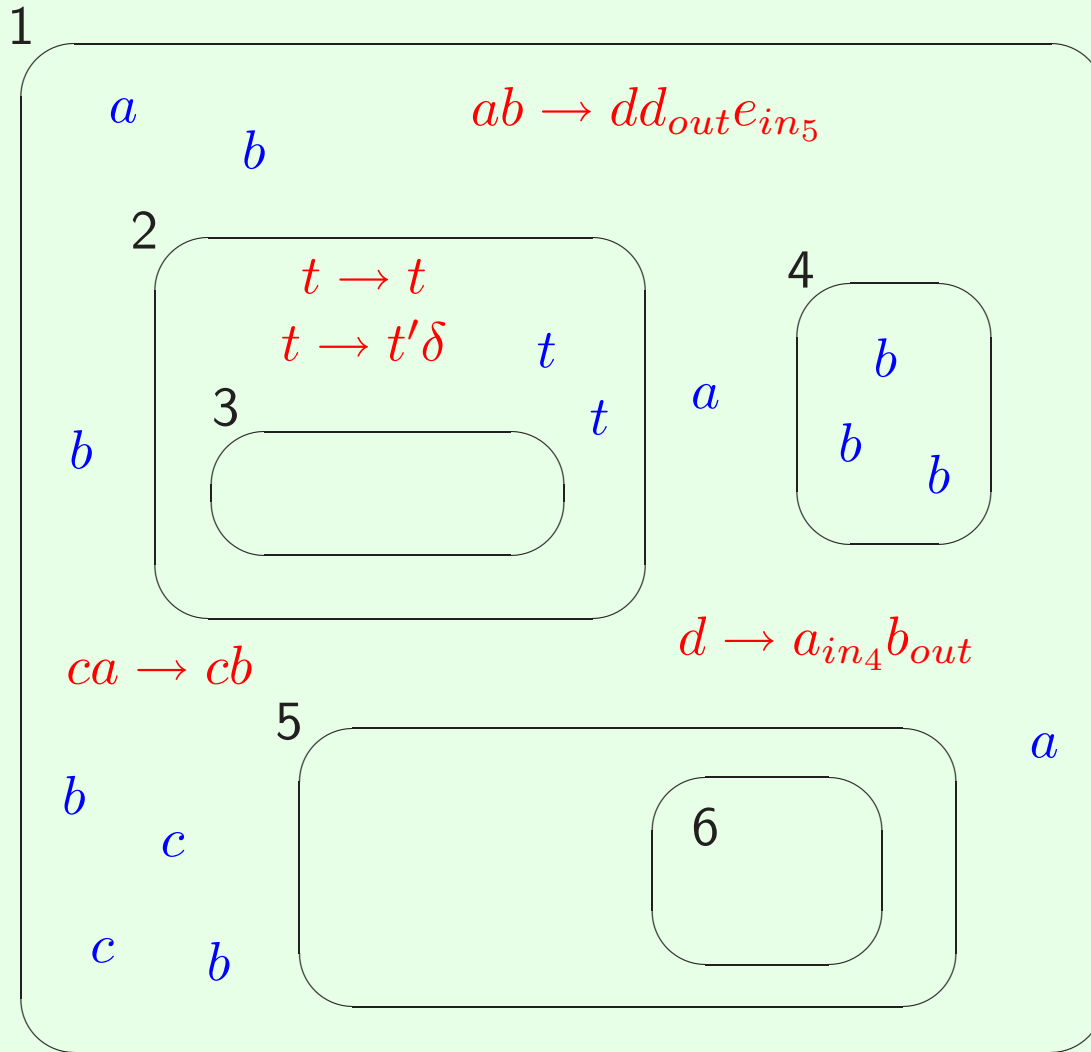
Importance of membranes for biology: . . .

MARCUS: *Life = DNA software + membrane hardware*

# THE BASIC IDEA







## A bird eye view to the MC jungle:

- cell-like, tissue-like, neural-like (spiking neural) systems
- symbols, strings, arrays, numerical variables, etc.
- multisets, sets, fuzzy
- multiset rewriting, symport/antiport, membrane evolving, combinations
- controls: priority, promoters, inhibitors,  $\delta$ ,  $\tau$ , activators,
- maximal, bounded, minimal parallelism, sequential/asynchronous, time-, clock-free
- generating, accepting, computing/translating, dynamical system
- computing power, computing efficiency, others
- colonies
- implementations/simulations
- applications: biology/medicine, economics, optimization, computer graphics, linguistics, computer science, cryptography, etc.
- etc. (e.g., brane-membrane bridge, quantum-like)

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## Results:

- characterization of **Turing computability** ( $RE$ ,  $NRE$ ,  $PsRE$ )  
Examples: by catalytic P systems (2 catalysts) [Sosik, Freund, Kari, Oswald]  
by (small) symport/antiport P systems [many]  
by spiking neural P systems [many]
- polynomial solutions to **NP-complete problems** (by using an exponential workspace created in a “biological way”: membrane division, membrane creation, string replication, etc.) [Sevilla team], [Madras team], [Obtulowicz], [Alhazov, Pan] etc.  
even characterizations of **PSPACE**
- other types of **mathematical results** (normal forms, hierarchies, determinism versus nondeterminism, complexity) [Ibarra group]
- **connections** with ambient calculus, Petri nets, X-machines, quantum computing, lambda calculus, brane calculus, etc. [many]
- **simulations** and implementations
- **applications**



## Open problems, research topics:

Many: see the P page

- borderlines: universality/non-universality, efficiency/non-efficiency  
(local problems: the power of 1 catalyst, the role of polarizations, dissolution, etc.  
general problems: uniform versus semi-uniform, deterministic-confluent, pre-computed resources)
- semantics (events, causality, etc.)
- neural-like systems (more biology, complexity, applications, etc.)
- user friendly, flexible, and efficient (!) software for bio-applications
- MC and economics
- implementations (electronics, bio-lab)
- finding a killer-app

## SFAQ:

- computing beyond Turing? (no, but ...acceleration)
- what kind of implementation? (none, but ...Adelaide, Madrid, Technion-Haifa)
- why so many variants?
- why so powerful? (RE = CS + erasing)

## Applications:

- biology, medicine, ecosystems (continuous versus discrete mathematics) [Sevilla, Verona, Milano, Sheffield, Ruston-Lousiana, Trento, etc.]
- computer science (computer graphics, sorting/ranking, 2D languages, cryptography, general model of distributed-parallel computing) [many]
- linguistics (modeling framework, parsing) [Tarragona]
- optimization (membrane algorithms [Nishida, 2004], [many])
- economics ([Warsaw group], [R. Păun], [Vienna group])
- controlling robots ([Bucharest Polytechnical University])

## A typical application in biology/medicine:

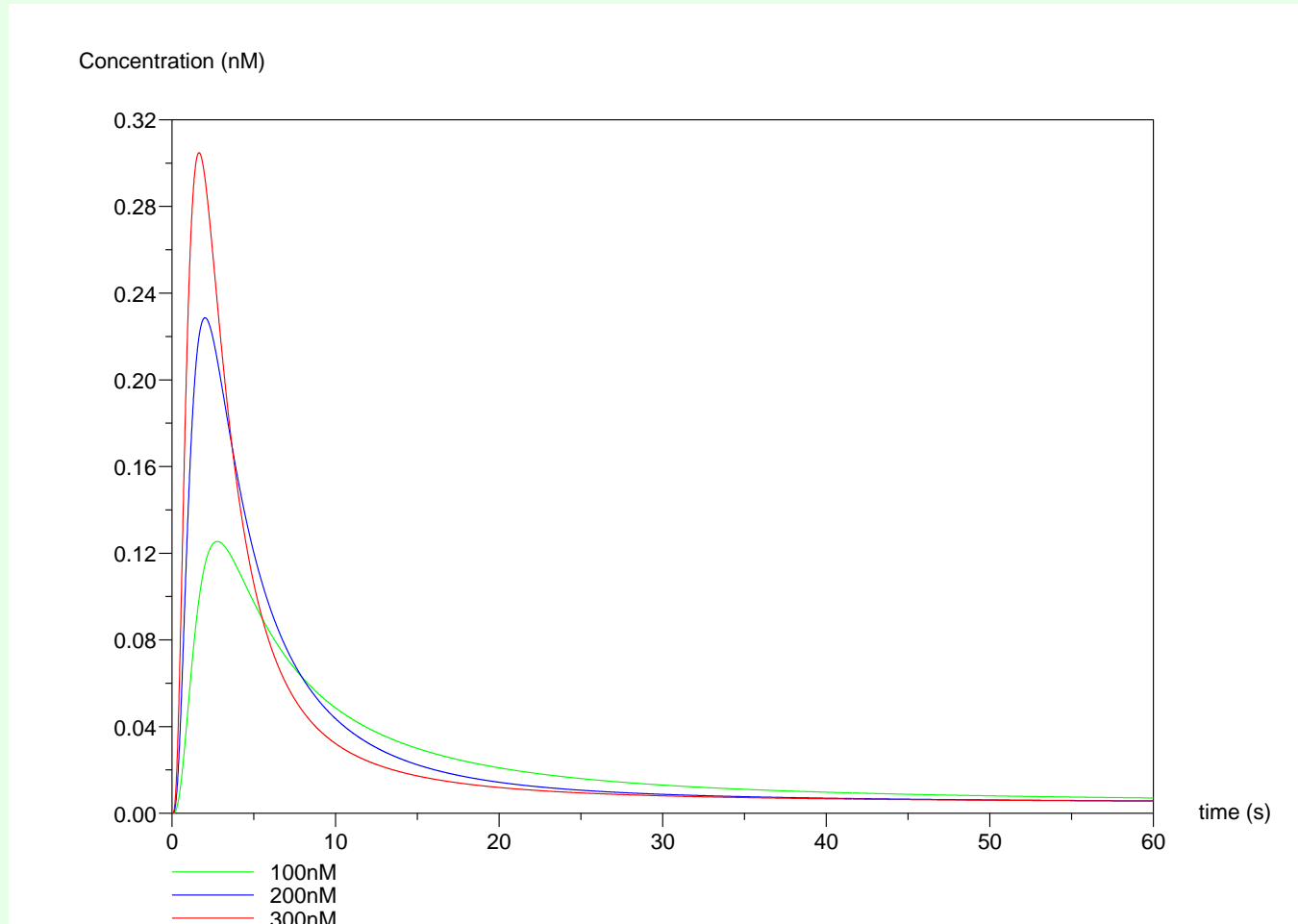
M.J. Pérez–Jiménez, F.J. Romero–Campero:

A Study of the Robustness of the EGFR Signalling Cascade Using Continuous Membrane Systems.

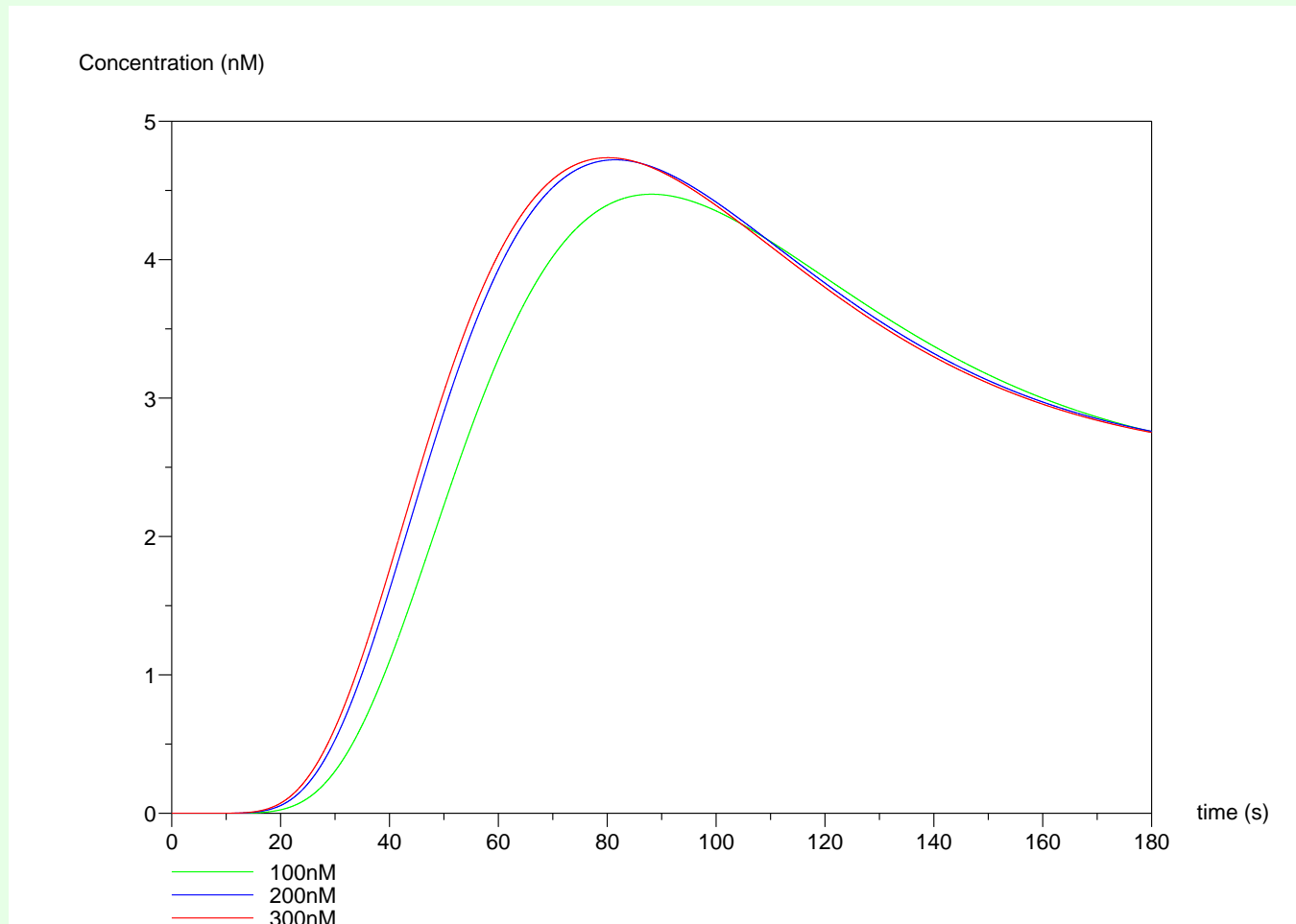
In *Mechanisms, Symbols, and Models Underlying Cognition. First International Work-Conference on the Interplay between Natural and Artificial Computation, IWINAC 2005* (J. Mira, J.R. Alvarez, eds.), LNCS 3561, Springer, Berlin, 2005, 268–278.

- 60 proteins, 160 reactions/rules
- reaction rates from literature
- results as in experiments

## Typical outputs:



The EGF receptor activation by auto-phosphorylation  
(with a rapid decay after a high peak in the first 5 seconds)



The evolution of the kinase MEK  
(proving a surprising robustness of the signalling cascade)

## Other bio-applications:

- photosynthesis [Nishida, 2002]
- Brusselator [Suzuki, Verona, Milano]
- quorum sensing in bacteria [Nottingham, Sheffield, Sevilla]
- circadian cycles [Verona]
- apoptosis [Ruston-Louisiana]
- signaling pathways in yeast [Milano]
- HIV infection [Edinburgh]
- peripheral proteins [Trento]
- others [Milano, Iași, Bucharest, Sevilla, Verona, etc.]

## Modeling ecosystems

Y. Suzuki, H. Tanaka, Artificial life and P systems, WMC1, Curtea de Argeş, 2000  
(herbivorous, carnivorous, volatiles)

Lotka-Volterra model (predator-prey) [Verona, Milano]

M. Cardona, M.A. Colomer, M.J. Perez-Jimenez, S. Danuy, A. Margalida,  
A P system modeling an ecosystem related to the bearded vulture, 6BWMC



## Applications in economics:

- J. Bartosik, W. Korczynski, etc. (accounting, human resource management, etc.)
- Vienna group (Freund et colab.)
- Gh. Păun, R. Păun (general interpretation, [Numerical P systems](#), modeling producer-retailer transactions)

### Nishida's membrane algorithms:

- candidate solutions in regions, processed locally (local sub-algorithms)
- better solutions go down
- static membrane structure – dynamical membrane structure
- two-phases algorithms

Excellent solutions for Travelling Salesman Problem (benchmark instances)

- rapid convergence
- good average and worst solutions (hence reliable method)
- in most cases, better solutions than simulated annealing

Still, many problems remains: check for other problems, compare with sub-algorithms, more membrane computing features, parallel implementations (no free lunch theorem)

**Recent:** L. Huang, N. Wang, J. Tao; G. Ciobanu, D. Zaharie; A. Leporati, D. Pagani; M. Gheorghe et al. (quantum-membrane-algorithms)

## What about future? (at the edge of science-fiction)

- hard to predict the future...
- ...but the progresses should not be underestimated
- natural computing will pay-off (directly, or through by-products)
- e.g., through nano-technology

## Dreams:

- efficiency (through massive parallelism, nondeterminism)
- robust computers/algorithms
- adaptable, evolvable, learning, self-healing hardware/software
- nano-robots (for medicine)
- computing beyond Turing (stronger consequences than **P = NP**)

## Do we dream too much?

- nature has different goals (and resources: time, materials, energy), is redundant, cruel
- theoretical limits:
  - Conrad theorems (programmability/universality, efficiency, learnability are contradictory)
  - Gandy principles for computing mechanisms (preventing the possibility to go beyond Turing)
- for modeling/simulating intelligence and life, maybe something essentially new is necessary (McCarthy, Brooks, etc.)

*Every attempt to employ mathematical methods in the study of biological questions must be considered*

*Every attempt to employ mathematical methods in the study of biological questions must be considered profoundly irrational and contrary to the spirit of biology.*

*If mathematical analysis should ever hold a prominent place in biology - an aberration which is happily almost impossible - it would occasion a rapid and widespread degeneration of that science.*

*Auguste Comte (full name: Isidore Marie Auguste François Xavier Comte; January 17, 1798 - September 5, 1857): Philosophie Positive, 1830*

*Thank you!*

*...and please do not forget:* <http://ppage.psyste.ms.eu>

*(with mirrors in China:* <http://bmc.hust.edu.cn/psystems>,  
<http://bmchust.3322.org/psystems>*)*