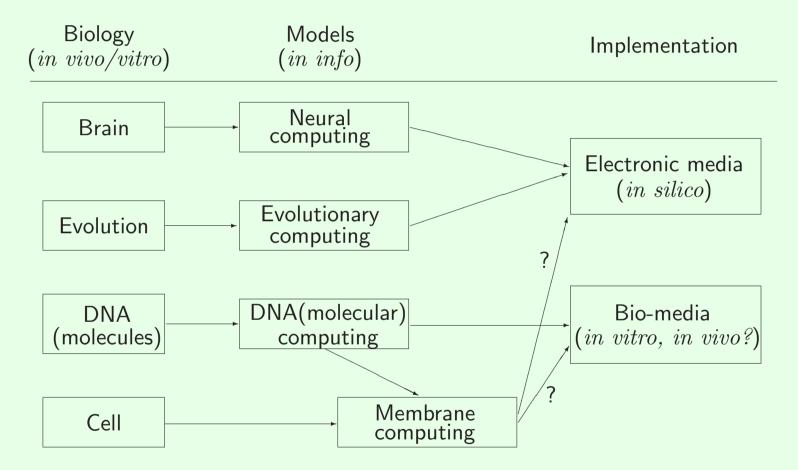
## **Spiking Neural P Systems**

Gheorghe Păun Romanian Academy, Bucharest, RGNC, Sevilla University, Spain george.paun@imar.ro, gpaun@us.es

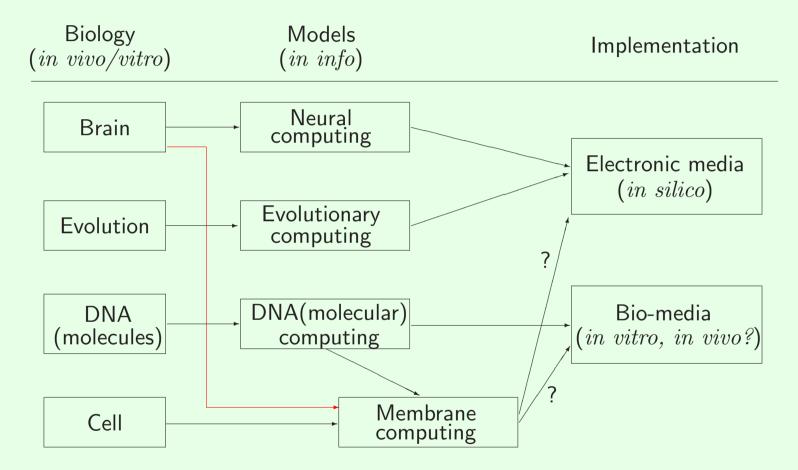
#### TOPICS:

- framework: natural computing/membrane computing
- generalities (spiking neurons)
- SN P systems
- types of results (generating/accepting numbers, languages)
- small universal systems
- handling strings and infinite sequences
- recent ideas: parallelism, asynchronous, complexity
- many problems and research topics

#### FRAMEWORK: Natural computing/membrane computing



#### FRAMEWORK: Natural computing/membrane computing



Gh. Păun: Spiking Neural P Systems

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)

#### 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)
   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
- Website: http://psystems.disco.unimib.it

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

### (TYPES OF) RESULTS

- Turing completeness/universality
- polynomial solutions to hard problems (time-space trade-off)
- applications: biology, bio-medicine, economics, linguistics, computer science, optimization

#### SOFTWARE AND APPLICATIONS:

http://www.dcs.shef.ac.uk/~marian/PSimulatorWeb/P\_Systems\_applications.htm
www.cbmc.it - PSim2.X simulator

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

Sheffield (Marian Gheorghe: M.Gheorghe@dcs.shef.ac.uk)

Sevilla (Mario Pérez-Jiménez: marper@us.es)

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

Nottingham, Leiden, Vienna, Evry, Iași

#### Spiking neural P systems

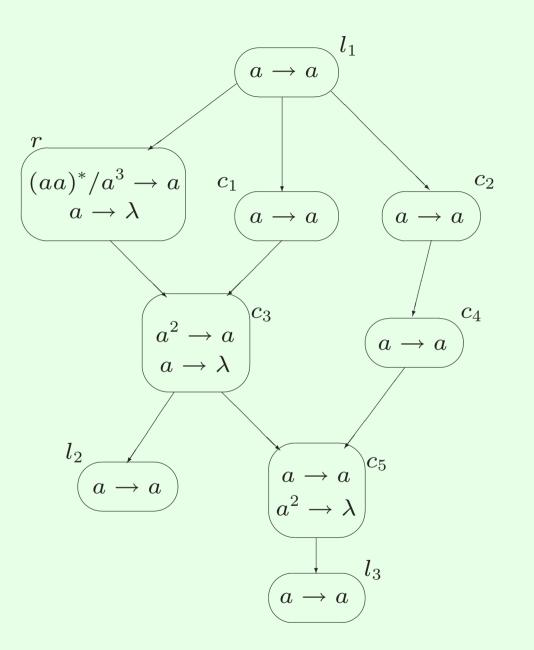
- 1. M. Ionescu, Gh. Păun, T. Yokomori: Spiking neural P systems, *Fundamenta* Informaticae, 71 (2006)
- 2. Gh. Păun, M.J. Pérez-Jiménez, G. Rozenberg: Spike trains in spiking neural P systems, *Intern. J. Found. Computer Sci.*, 17 (2006).
- 3. Gh. Păun, M.J. Pérez-Jiménez, G. Rozenberg: Infinite spike trains in spiking neural P systems, submitted, 2005.
- H. Chen, R. Freund, M. Ionescu, Gh. Păun, M.J. Pérez-Jiménez: On string languages generated by spiking neural P systems, *Fundamenta Informaticae*, 75 (2007).
- 5. A. Păun, Gh. Păun: Small universal spiking neural P systems, *BioSystems*, 90 (2007).
- 6. several other papers (e.g., 4th BWMC, WMC7, WMC8)

#### GENERAL REFERENCES ON SPIKING NEURAL NETS:

- 1. W. Maass: Computing with spikes. Special Issue on Foundations of Information Processing of TELEMATIK, 8, 1 (2002), 32–36.
- 2. W. Maass, C. Bishop, eds.: *Pulsed Neural Networks*, MIT Press, Cambridge, 1999.

W. Maass movie about spiking neurons:

http://www.igi.tugraz.at/tnatschl/spike\_trains\_eng.html



 $l_1:(\mathsf{SUB}(r),l_2,l_3)$ 

#### Gh. Păun: Spiking Neural P Systems

FORMAL DEFINITION: a *spiking neural* P *system* (in short, an SN P system), of degree  $m \ge 1$ , is a construct of the form

$$\Pi = (O, \sigma_1, \ldots, \sigma_m, syn, in, out),$$

where:

1.  $O = \{a\}$  is the singleton alphabet (a is called *spike*);

2.  $\sigma_1, \ldots, \sigma_m$  are *neurons*, of the form

$$\sigma_i = (n_i, R_i), 1 \le i \le m,$$

where:

a)  $n_i \ge 0$  is the *initial number of spikes* contained by the neuron; b)  $R_i$  is a finite set of *rules* of the following two forms:

- (1)  $E/a^c \rightarrow a; d$ , where E is a regular expression with a the only symbol used,  $c \ge 1$ , and  $d \ge 0$ ;
- (2)  $a^s \to \lambda$ , for some  $s \ge 1$ , with the restriction that  $a^s \in L(E)$  for no rule  $E/a^c \to a; d$  of type (1) from  $R_i$ ;
- 3.  $syn \subseteq \{1, 2, \ldots, m\} \times \{1, 2, \ldots, m\}$  with  $(i, i) \notin syn$  for  $1 \le i \le m$  (synapses among neurons);
- 4.  $in, out \in \{1, 2, ..., m\}$  indicate the *input* and the *output neuron*.
- only **out** = generative system
- only in = accepting system
- both in, out = computing system

Spike trains, types of output

FAMILIES:  $Spik_{gen}P_m(rule_k, cons_p, forg_q)$  – generative  $Spik_{acc}P_m(rule_k, cons_p, forg_q)$  – accepting (DSpik, if deterministic)

**Theorem 1.**  $NFIN = Spik_{gen}P_1(rule_*, cons_1, forg_0) = Spik_{gen}P_2(rule_*, cons_*, forg_*)$ 

**Theorem 2.**  $Spik_{gen}P_*(rule_2, cons_3, forg_3) = Spik_{acc}P_*(rule_2, cons_3, forg_2) = NRE.$ 

**Theorem 3.**  $SLIN_1 = Spik_{gen}P_*(rule_k, cons_p, forg_q, bound_s)$ , for all  $k \ge 3$ ,  $q \ge 3$ ,  $p \ge 3$ , and  $s \ge 3$ .

#### Normal forms

#### PROBLEMS:

- Theorems 1, 3 for the accepting case
- Find classes of systems for which D < ND

Actually, strong determinism:  $L(E) \cap L(E') = \emptyset$  in each neuron

• Find classes of systems for which SD < D

Automata theory observation:

state complexity of E rather reduced (only  $a^*, a, a^2$  necessary)

Language generating:

• in the standard model: over the binary alphabet

**Theorem 4.** (i) There are finite languages (for instance,  $\{0^k, 10^j\}$ , for any  $k \ge 1, j \ge 0$ ) which cannot be generated by any SN P system, but for any  $L \in FIN, L \subseteq B^+$ , we have  $L\{1\} \in LFSNP_1(rule_*, cons_*, forg_0)$ , and if  $L = \{x_1, x_2, \ldots, x_n\}$ , then we also have  $\{0^{i+3}x_i \mid 1 \le i \le n\} \in LFSNP_*(rule_*, cons_1, forg_0)$ .

(ii) The family of languages generated by finite SN P systems is strictly included in the family of regular languages over the binary alphabet, but for any regular language  $L \subseteq V^*$  there is a finite SN P system  $\Pi$  and a morphism  $h: V^* \longrightarrow B^*$ such that  $L = h^{-1}(L(\Pi))$ .

(iii)  $LSNP_*(rule_*, cons_*, forg_*) \subset REC$ , but for every alphabet  $V = \{a_1, a_2, \ldots, a_k\}$  there are a morphism  $h_1 : (V \cup \{b, c\})^* \longrightarrow B^*$  and a projection  $h_2 : (V \cup \{b, c\})^* \longrightarrow V^*$  such that for each language  $L \subseteq V^*$ ,  $L \in RE$ , there is an SN P system  $\Pi$  such that  $L = h_2(h_1^{-1}(L(\Pi)))$ .

• with extended rules  $(E/a^c \rightarrow a^p; d)$ : over any alphabet (with  $b_0 = \lambda$  or not – below,  $b_0 = \lambda$ )

**Theorem 5.** (i)  $FIN = LSN^eP_1(rule_*, cons_*, prod_*)$  and this result is sharp, because  $LSN^eP_2(rule_2, cons_2, prod_2)$  contains infinite languages.

(ii)  $LSN^eP_2(rule_*, cons_*, prod_*) \subseteq REG \subset LSN^eP_3(rule_*, cons_*, prod_*)$ ; the second inclusion is proper, because  $LSN^eP_3(rule_3, cons_4, prod_2)$  contains non-regular languages; actually, the family  $LSN^eP_3(rule_3, cons_6, prod_4)$  contains non-semilinear languages.

(iii)  $RE = LSN^e P_*(rule_*, cons_*, prod_*).$ 

The accepting case not considered yet

#### SMALL UNIVERSAL SN P SYSTEMS

**Theorem 6.** There is a universal computing SN P system with standard rules having 84 neurons, and one with extended rules which has 49 neurons.

**Theorem 7.** There is a universal generating SN P system with standard rules having 76 neurons, and one with extended rules which has 50 neurons.

Korec, TCS, 1996 (plus "code optimization")

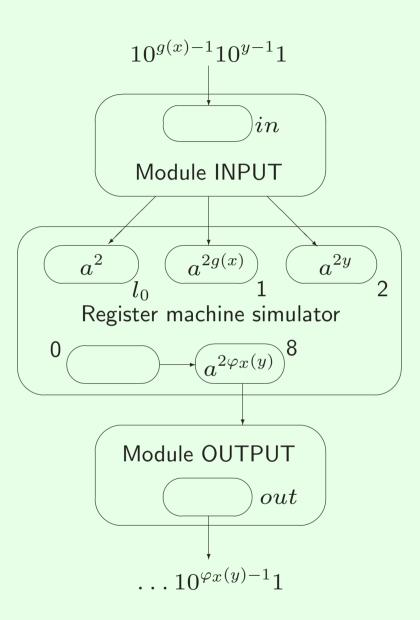


Figure 1: The general design of the universal SN P system

Gh. Păun: Spiking Neural P Systems

Pisa 2007

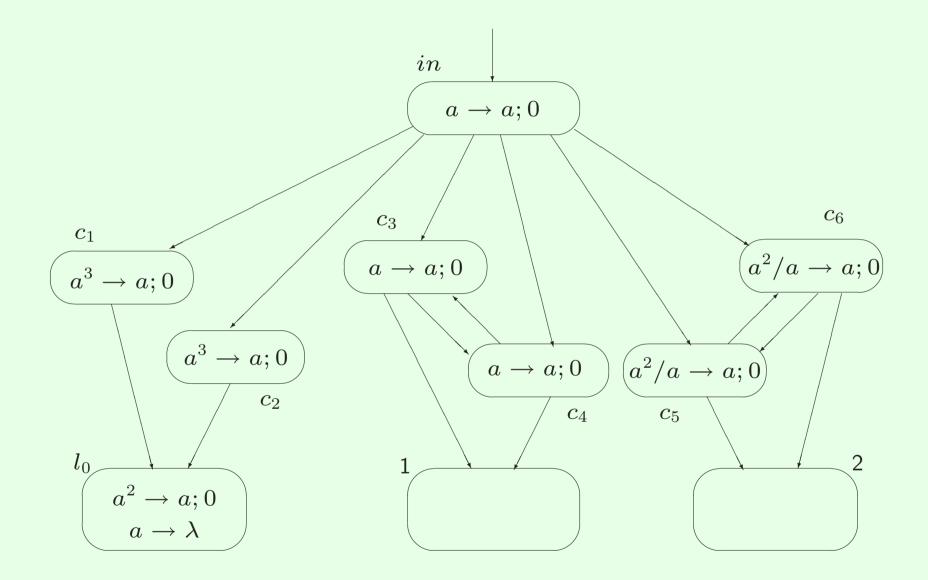


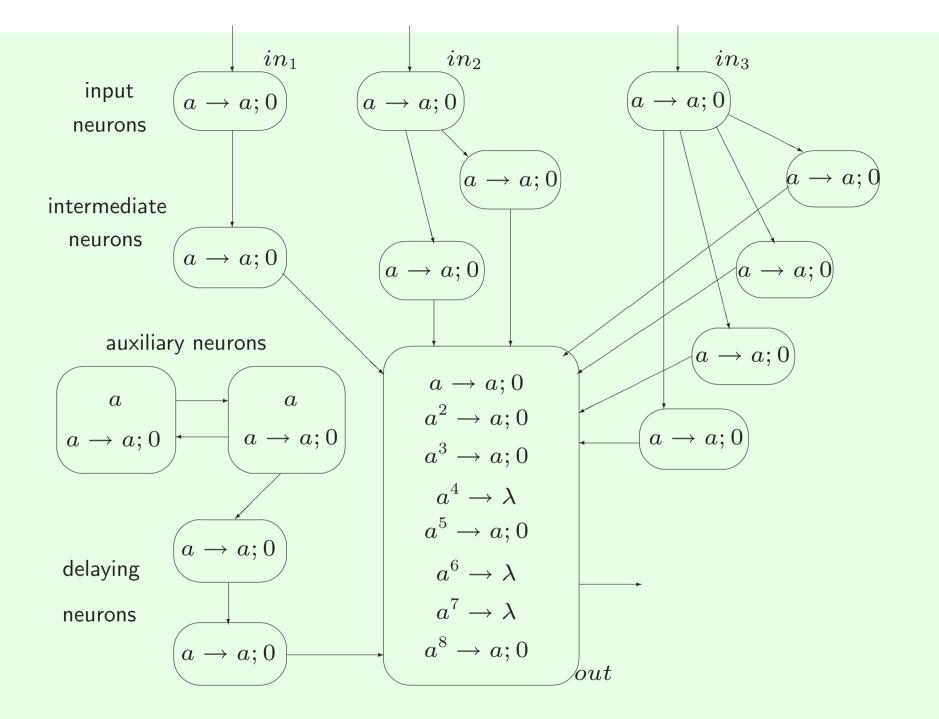
Figure 2: Module INPUT

#### COMPUTING (INFINITE) STRING FUNCTIONS:

**Theorem 8.** Any function  $f : \{0,1\}^k \longrightarrow \{0,1\}$  can be computed by an SN P transducer with k input neurons (also using further  $2^k + 4$  neurons, one being the output one).

Example:  $f: \{0,1\}^3 \longrightarrow \{0,1\}$  defined by

 $f(b_1, b_2, b_3) = 1$  iff  $b_1 + b_2 + b_3 \neq 2$ .



Computing morphisms:

- length preserving: YES (they are boolean functions)
- erasing: YES (the output is of the form  $w^{\omega}$ )
- otherwise: YES if  $w^{\omega}$ , NOT otherwise:

**Theorem 9.** Let  $h : \{0,1\}^* \longrightarrow \{0,1\}^+$  be a morphism with the following two properties:

1.  $|h(1)| = r \ge 2$ ,

2. we cannot write  $h(0) = u^i$  and  $h(1) = u^j$  for some  $u \in \{0, 1\}^+$  and  $i, j \ge 1$ .

Then, there is no SN P transducer  $\Pi$  such that  $\Pi(w) = 0^s h(w)$  for any given  $s \ge 0$ and all  $w \in \{0,1\}^* \cup \{0,1\}^{\omega}$ . However, we have (a *k*-block morphism is a function  $f : \{0,1\}^k \longrightarrow \{0,1\}^k$ prolonged to a function  $f : \{0,1\}^\omega \longrightarrow \{0,1\}^\omega$  by

$$f(x_1x_2\ldots) = f(x_1)f(x_2)\ldots,$$

for all  $x_1, x_2, \ldots \in \{0, 1\}^k$ ):

**Theorem 10.** If  $f : \{0,1\}^2 \longrightarrow \{0,1\}^2$  is a 2-block morphism, then there is an SN *P* transducer  $\Pi$  such that for all  $w \in \{0,1\}^{\omega}$  we have  $\Pi(w) = 0^5 f(w)$ .

**Conjecture**: valid for all k

Recent developments:

- Exhaustive use of rules: universality again (both as number generators and acceptors;  $3^n$  for n in a register)
- Asynchronous: universality for extended rules, open for usual rules (conjecture: not universal)
- Complexity: nondeterministic SN P systems solve NP-complete problems in constant time, Milano theorem for a restricted case
- Astrocytes
- Packages of spikes, specified synapses, sub-universal classes, etc.

#### Research topics:

- use the rules in the maximally parallel way
- complexity, solving computationally hard problems
- rules of different forms (e.g., E/a<sup>n</sup> → a<sup>f(n)</sup>, with "easy-to-compute" partial function f; use when E covers the neuron, removing the maximal number of spikes, n, for which f is defined, or rules E/a<sup>∞</sup> → a<sup>p</sup>, meaning that all spikes are consumed)
- inhibitory spikes, decaying time for spikes
- neural computing ingredients (learning/training, pattern recognition)
- (short/long term) memory
- applications

# Thank you!

...and please do not forget: http://psystems.disco.unimib.it