# Simulation of Computing P Systems: A GPU Design for the Factorization Problem

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Simulation of Computing P Systems

#### Contents

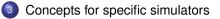


GPU computing fundamentals



GPU simulators for P systems

- Structure of a GPU simulator
- State of the art
- Other P system models

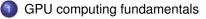


#### Future research lines





#### Outline





GPU simulators for P systems

- Structure of a GPU simulator
- State of the art
- Other P system models
- 3 Concepts for specific simulators





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#### GPU computing

- Graphics Processor Unit (GPU)
- Data-parallel computing model:
  - SPMD programming model (Same Program for Multiple Data)
  - Shared memory system
- New programming languages: CUDA, OpenCL, DirectCompute
- A GPU features thousand of cores

#### NVIDIA's technology

#### CUDA programming model<sup>1</sup>

- Heterogeneous model: CPU (host) + GPU (device).
- All threads execute the same code (kernel) in parallel.
- Three-level hierarchy of threads (grid, blocks, threads).
- Memory hierarchy (global, shared within block).

1 W.-M. Hwu, D. Kirk. Programming massively parallel processors, Morgan Kaufmann, 2010. 🗆 🕨 🛪 🗇 🕨 🛪 🖹 🕨 📲

# Why is the GPU interesting for simulating P systems?

#### Desired properties:

- High level of parallelism (up to 4000 cores)
- Shared memory system (easily synchronized)
- Scalability and portability
- Known languages: C/C++, Python, Fortran...
- Cheap technology everywhere (cost and maintenance)
- Undesired properties:
  - Best performance requires lot of research.
  - Programming model imposes many restrictions







#### Outline





# GPU simulators for P systemsStructure of a GPU simulator

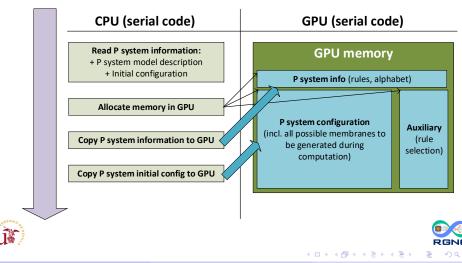
- State of the art
- Other P system models



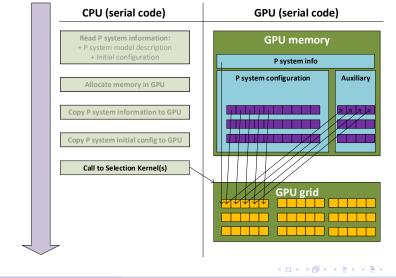




#### GPU simulator workflow - Initialization (I)

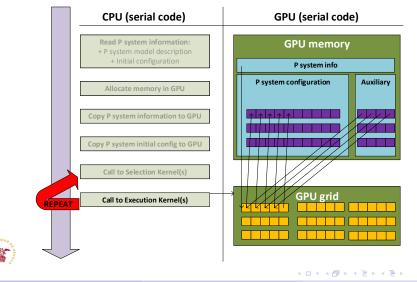


#### GPU simulator workflow - Simulation - Selection (II)



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#### GPU simulator workflow - Simulation - Execution (III)

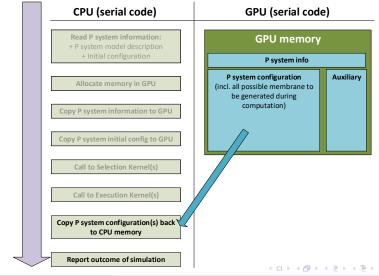


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#### GPU simulator workflow - Wrap up (IV)



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#### Simulation approaches

• Generic approach: simulator for a variant / class (under restrictions).

• Specific approach: simulator for a certain family / model.



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Image: A matrix and a matrix



#### State of the art

# Simulating models ("generic" approach)

P systems with active membranes

- Rooted tree of membranes.
- Polarization and no cooperation (only one object in LHS).
- Rules: Evolution, send-in, send-out, division and dissolution. ۰
- Assumptions to simplify the simulator:
  - Confluent models
  - Only two-level trees (skin and elementary membranes)



#### Simulating models ("generic" approach)

Mapping double parallelism:

- Membranes to Thread Blocks
- Objects to Threads: thanks to no-cooperative rules, it is enough to check the existence of one object to trigger a rule.



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# Simulating models ("generic" approach)

Performance analysis

- Two benchmarks (on a C1060 with 240 cores):
  - A. A simple test P system<sup>2</sup>
    - Max speedup: 5.8x
  - B. An efficient solution to SAT
    - Max speedup: 1.5x ( $n = 18, 2^{18}$  membranes)
- Density of objects per membrane: -

Reality

#Objects AlphabetSize

- Test A: 100%
- Test B:  $\sim$  15%

<sup>2</sup> One division rule:  $[d]_2 \rightarrow [d]_2 [d]_2$ , Many evolution rules:  $[a_{\bar{i}} \rightarrow a_{\bar{i}}]_2$ ,  $0 \le i \le N$   $\ge 0 < C$ M.Á. Martínez-del-Amor et al. (RGNC) Simulation of Computing P Systems CMC19, Dresden (Germany) 16/37

# Simulating models ("generic" approach)

Performance analysis

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    - Max speedup: 5.8x
  - B. An efficient solution to SAT
    - Max speedup: 1.5x ( $n = 18, 2^{18}$  membranes)
- Density of objects per membrane:  $\frac{Reality}{WorstCase} = \frac{\#Objects}{AlphabetSize}$ 
  - Test A: 100%
  - Test B: ~ 15%

<sup>2</sup>One division rule:  $[d]_2 \rightarrow [d]_2 [d]_2$ , Many evolution rules:  $[o_{\bar{p}} \rightarrow o_{\bar{l}}]_2$ ,  $0 \le i \le N$  =  $\circ \land \circ$ M.Á. Martínez-del-Amor et al. (RGNC) Simulation of Computing P Systems CMC19, Dresden (Germany) 16/37

#### State of the art

#### Simulating models ("generic" approach)

Foreseen performance by Sevilla Carpets: D. Orellana-Martín et al. Sevilla Carpets revisited: Enriching the Membrane Computing toolbox. Fundamenta Informaticae, 134 (2014), 153-166. The flatter the carpet, the higher the parallel degree in the system (and so, in the simulation).

Cell-like solution to SAT

- P systems with active membranes
- A specific linear time solution to SAT, with exponential workspace
- Encoding:
  - Objects: literals of the formula and auxiliary (counters, etc.)
  - Membranes: truth assignments
- A 4-staged solution:
  - Generation
  - Synchronization
  - Oheck out
  - Output



Cell-like solution to SAT - parallel design

- Membranes to Thread Blocks
- Objects in initial multiset to Threads: we have constrained the number of threads to the amount of different objects in the initial multiset.



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Tissue-like solution to SAT

- Tissue P systems with cell division
  - Directed graph of cells.
  - No polarization and cooperation (multisets in LHS)
  - Communication (symport/antiport) and division rules.
  - Active environment.
- A specific linear time solution to SAT, with exponential workspace
- Encoding:
  - Objects: literals of the formula and auxiliary (counters, etc.)
  - Cell: truth assignment
- A 5-staged solution:
  - Generation
  - Exchange
  - Synchronization
  - Ochecking



Tissue-like solution to SAT

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- A 5-staged solution:
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  - Exchange
  - Synchronization
  - Checking
  - Output



Tissue-like solution to SAT - parallel design

- Cells to Thread Blocks
- Objects in initial multiset, objects for truth assignation, and auxiliary objects to Threads: selection of rules is not direct given that there is cooperation.



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Performance analysis

- Cell-like approach:
  - Max speedup: 63x (n = 21)
- Tissue-like approach:
  - Max speedup: 10x (n = 21)

#### Conclusion:

- Charges save space, and help to increase object density
- No-cooperation avoids synchronization issues
- Shallow P systems (no more than skin and elementary membranes)

#### State of the art

# Simulating models ("specific" approach)

Performance analysis

- Cell-like approach:
  - Max speedup: 63x (n = 21)
- Tissue-like approach:
  - Max speedup: 10x (n = 21)
- Conclusion:
  - Charges save space, and help to increase object density
  - No-cooperation avoids synchronization issues
  - Shallow P systems (no more than skin and elementary membranes)

#### Outline





#### GPU simulators for P systems

- Structure of a GPU simulator
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- Concepts for specific simulators







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# PMCGPU project: http://sourceforge.net/projects/pmcgpu

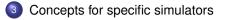
Simulator Codename	P system model and Peak coverage speedup		GPU tested	
PCUDA	(G) Active membranes $7x(T)$ 1.67x (R)		C1060	
PCUDASAT	(S) Active membranes 63x (R)		C1060	
TSPCUDASAT	(S) Tissue w/ cell division 10x (R)		C1060	
ABCDGPU	(G) Population Dynamics	18.1x (T) 5x (R)	K40	
ENPS-GPU	(G) Enzimatic Numerical	10x (T)	GTX460M	
CuSNP	(G) Spiking Neural	50x (R)	GTX750	

G= Generic, S=Specific, T=Stress testing, R=Real examples.

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#### Future research lines





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#### Case study: FACTORIZATION problem

- Given a natural number which is the product of two prime numbers, find its decomposition.
- Partial function FACT from *N* to  $N^2$ : FACT(x) = (y, z)
- Solution presented in WMC/UCNC 2018:
  - a family {Π(n)|n∈N} of (binary) computing polarizationless P systems with active membranes
  - makes use of minimal cooperation and minimal production
  - no dissolution rules
  - no division rules for non-elementary membranes



# Case study: FACTORIZATION problem

Stages in the computation of  $\Pi(n)$ :

- Generation
- 2 Multiplication
- Equality checking
- Trivial solution check
- First delete
- Second delete
- Output 1
- Output 2





# Case study: FACTORIZATION problem

More features:

- After generation,  $\Pi(n)$  contains  $2^{2n+2}$ , where  $n = k_x$ , being x an instance of the problem (x has n + 1 digits in its binary representation).
- The computation takes at most 19n + 28 steps.

Some rules:

$$\begin{split} & \left[ a_j \, \overline{X}_j \to X_j \, \right] \,, \, \text{for} \, 0 \leq j \leq n \\ & \left[ \alpha_{1,j,s} \to \alpha_{1,j,s+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq n \text{ and } 0 \leq s < j \\ & \left[ \alpha_{2,j,s} \to \alpha_{2,j,s+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq n \text{ and } 0 \leq s < n+1+j \\ & \left[ \beta_{1,j,k} \to \beta_{1,j,k+1} \, \right]_2 \,, \\ & \left[ \beta_{2,j,k} \to \beta_{2,j,k+1} \, \right]_2 \, \right\} \, \text{for} \, 0 \leq j \leq n, 0 \leq k \leq 3n+5 \\ & \left[ \overline{P}_{j,k} \to \overline{P}_{j,k+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq 2n+1, 0 \leq k \leq 5n+7 \\ & \left[ p_{i,j} \to p_{i,j+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq n, 0 \leq j \leq 5n+9 \\ & \left[ \tau_{j,k} \to \tau_{j,k+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq n, 0 \leq k \leq 14n+11 \\ & \left[ \omega_{j,k} \to \omega_{j,k+1} \, \right]_2 \,, \, \text{for} \, 0 \leq j \leq n, 0 \leq k \leq 15n+21 \\ & \left[ \omega_{i,j} \to \omega_{i,j+1} \, \right]_1 \,, \, \, \text{for} \, 0 \leq i \leq n, 0 \leq j \leq 17n+25 \end{split}$$



Considerations:

- No need to do selection execution (we know the rules)
- No need to do per-transition simulation (we can take short paths)
- No need to store rules in memory (we know the rules!!)
- Under control: we should be able to know, looking into the simulator, the state of the P system at every transition

Common designs:

- Models are normally designed by staged computations
- Each one with different behaviour (generation, checking, ...)
- A kernel per stage



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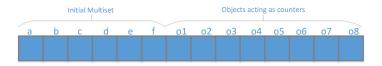
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Increasing density of objects: from sparse to dense representation



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Design decisions:

- Objects acting as counters, variable or in memory?
- Are we able to set an upper-bound of objects appearing in membranes? Minimal production helps!!
- Do we know the maximum amount of membranes?
- A kernel or several kernels per stage?
- Fusing kernels for simple stages?



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#### Outline





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#### **GPU-oriented P systems**

- MABICAP: Bio-inspired machines over high performance platforms.
- Seeking P system models well-suited for GPU deployments.
- Selection of best ingredients, while keeping computing power and expressibility:
  - Charges
  - Minimal production
  - Minimal (almost no-) cooperation
  - Shallow structure (horizontal parallelism)
- Towards efficient simulation of Spiking Neural P systems (sparse representation)



#### New GPU features

- Kernel compilation in runtime (customizable to the model)
- Cooperative Groups (for deeper P systems)
- Tensor cores (matrix representations for SNP systems)
- Dynamic Parallelism (to be seen...)
- Faster memory
- Cloud





#### **Coming Calls**

**BICAS 2019**: Biologically Inspired Parallel and Distributed Computing, Algorithms and Solutions

- Part of HPCS 2019 (a CORE B conference)
- Dublin (Ireland), July 15 19, 2019
- Deadline: TBD (around March)
- Proceedings in IEEE Xplore
- Special issues in ISI journals (FGCS, CCPE, ...)
- http://hpcs2019.cisedu.info



#### **Coming Calls**

#### BWMC 2019: Brainstorming Week on Membrane Computing

- Sevilla (Spain)
- Dates: 5-8 February
- Announcements at RGNC website: http://www.gcn.us.es





# Thank you for your attention! Vielen Dank für Ihre Beachtung!

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