

Networks with discrete dynamics

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Project-team TREC

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Networks with discrete dynamics

Dynamics

- ▶ Discrete (time or events).
- ▶ Markovian.

Results

- ▶ Stability.
- ▶ Performance evaluation/bounds.
- ▶ Control.

Models

- ▶ Queueing networks.
- ▶ Probabilistic cellular automata.

Main techniques

- ▶ Simulation (perfect sampling).
- ▶ Markov reward/decision processes.
- ▶ Stochastic orders.
- ▶ Percolation.

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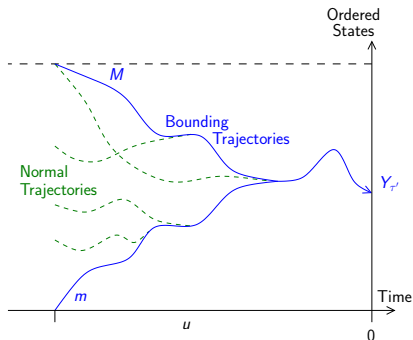
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Zoom: Envelope perfect sampling



Challenges:

- ▶ Envelope computation.
- ▶ Coupling time.
- ▶ State space (without lattice structure, infinite case).

Almost Space Homogeneous Events

B., Gaujal, Pin. Performance Evaluation 2012.

$\mathcal{X} = [0, C]$, where $C = (C_1, \dots, C_d) \in \mathbb{Z}^d$ and $x \leq y \Leftrightarrow x_i \leq y_i, \forall i$;
 $[m, M] = [m_1, M_1] \times \dots \times [m_d, M_d]$.

An event a is an **almost space homogeneous event** (ASHE) if there exists a vector $v \in \mathbb{Z}^n$ (**direction vector**) and a binary relation \mathcal{R} (**blocking relation**) on $\{1, \dots, d\}$ s.t. for all x in \mathcal{X} :

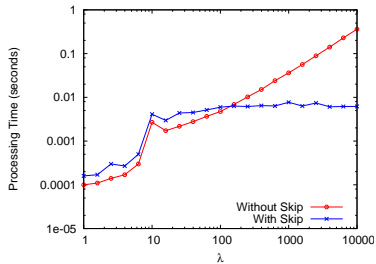
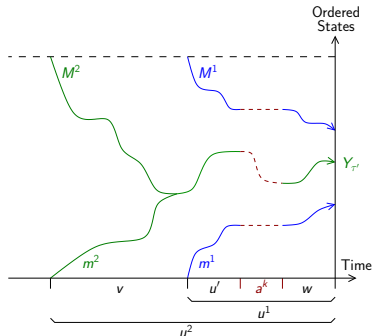
Let $B(x) \stackrel{\text{def}}{=} \{i : x_i + v_i \notin [0, C_i] \text{ and } \exists j \in CR(x), (j, i) \in \mathcal{R}\}$ the set of **blocked** components in x .

For all i :

$$(x \cdot a)_i = \begin{cases} x_i, & i \in B(x), \\ [(x_i + v_i) \wedge C_i]^+, & i \notin B(x). \end{cases}$$

Complexity of envelope computation: $O(|\mathcal{R}|) = O(d^2)$.

Skipping of events

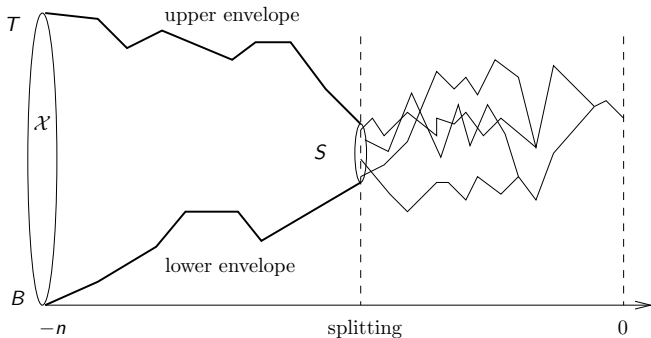


Pin, B., Gaujal. Valuetools 2011.

Beyond envelopes

When the coupling time for envelopes is too long
(or if they do not couple):

- ▶ bounds
- ▶ splitting



Zoom: Cellular automata

Cell space: any finite or countable group $(G, +)$.

Alphabet: a finite set \mathcal{A} .

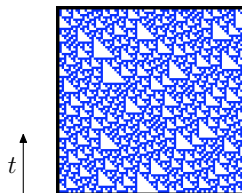
Definition by S. Ulam and J. von Neumann (50's)

A **cellular automaton** is a function $F : \mathcal{A}^G \rightarrow \mathcal{A}^G$ characterized by

- ▶ a finite neighborhood $V \subset G$,
- ▶ a local function $f : \mathcal{A}^V \rightarrow \mathcal{A}$ such that $F(x)_k = f((x_{k+v})_{v \in V})$.

Applications

- ▶ math. model for distributed computing.
- ▶ very simple description generating complex behaviors, models for physical and biological processes.
- ▶ $CA \Leftrightarrow$ continuous functions commuting with the shift (Hedlund, 1969)



$$G = (\mathbb{Z}, +), \mathcal{A} = \{0, 1\},$$

$$V = (0, 1),$$

$$F(x)_n = x_n + x_{n+1} \mod 2.$$

Probabilistic CA

$\mathcal{M}(\mathcal{A})$ the set of probability measures on \mathcal{A} .

A PCA is given by

- ▶ a finite neighbourhood $V \subset G$,
- ▶ a local function $\varphi : \mathcal{A}^V \rightarrow \mathcal{M}(\mathcal{A})$.

The cells are updated synchronously and independently, according to φ (depending on a finite neighbourhood).

This defines an application $F : \mathcal{M}(\mathcal{A}^G) \rightarrow \mathcal{M}(\mathcal{A}^G)$, $\mu \mapsto \mu F$.
($\mathcal{M}(\mathcal{A}^G)$ prob. measures on \mathcal{A}^G)

Def. A PCA is **ergodic** if it has a unique invariant measure π , and if for each measure $\mu \in \mathcal{M}(\mathcal{A}^G)$, the sequence μF^n converges weakly to π (i.e. $\mu F^n(C)$ conv. to $\pi(C)$ for any finite cylinder C).

The ergodicity of PCA is undecidable **Toom et al., 1990**.

Ergodicity of PCA on \mathbb{Z}

Set of cells: \mathbb{Z} . Even the ergodicity of DCA is undecidable.

B., Mairesse, Marcovici, STACS 2011.

Sufficient conditions: using coupling from the past.

New alphabet $\mathcal{B} = \{0, 1, ?\}$ (unknown letters replaced by “?”).

$g : \mathcal{B}^V \rightarrow \mathcal{M}(\mathcal{B})$, defined for each $y \in \mathcal{B}^V$ by

$$g(y)(0) = \min_{x \in \mathcal{A}^V, x \leq y} f(x)(0), \quad g(y)(1) = \min_{x \in \mathcal{A}^V, x \leq y} f(x)(1),$$

$$g(y)(?) = 1 - \min_{x \in \mathcal{A}^V, x \leq y} f(x)(0) - \min_{x \in \mathcal{A}^V, x \leq y} f(x)(1).$$

Theorem. There exists a critical value $0 < \alpha^* < 1$, depending only on $|V|$, such that F is ergodic if

$$g(?^V)(?) < \alpha^*.$$

Density classification

$\mathcal{A} = \{0, 1\}$, $p \in [0, 1]$. Initial distrib. μ_p on $\mathcal{A}^{\mathbb{Z}}$: i.i.d., 1 with prob. p .

Question: Find a CA (or PCA) such that

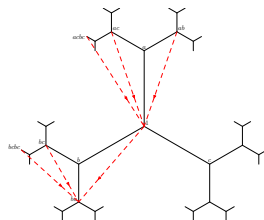
$$\begin{cases} p < 1/2 \implies \mu_p F^n \xrightarrow[n \rightarrow \infty]{w} \delta_{0^{\mathbb{Z}}} \\ p > 1/2 \implies \mu_p F^n \xrightarrow[n \rightarrow \infty]{w} \delta_{1^{\mathbb{Z}}} \end{cases}.$$

Results:

\mathbb{Z}^2 : Toom's rule



\mathbb{Z} : conjectured candidates



$$T_3 = \langle a, b, c \mid a^2 = b^2 = c^2 = 1 \rangle,$$

$$F(x)_g = \text{maj}(x_{gab}, x_{gac}, x_{gacbc}).$$

B., Fatès, Mairesse, Marcovici, LATIN 2012

Other results

Bounding techniques for Markov chains

Problem: combinatorial explosion of state space

Objective: to find another chain that provides **bounds** for the original chain and that is **simpler to analyze**.

Main result: B., Vliegen, Scheller-Wolf, Math. Oper. Res. 2012.

- ▶ Upper/lower bounds for **steady-state reward functions** by redirecting transitions to more/less attractive **sets of states**.
- ▶ Simplifying the model using **aggregation of states**.
- ▶ Application: ATO systems.

Bipartite matching

- ▶ Dynamic (queueing) variant.
- ▶ Stability (of a max-weight type policy; global)

Projects and collaborations

ANR MAGNUM (2010-14): random generation of complex combinatorial structures and simulation of random dynamical discrete systems.

Partners: **UPMC**, **Paris Diderot**, **University Paris Nord**.

ARC OCOQS (2011-12): Optimal threshold policies in COntrolled Queuing Systems.

With: Hyon (**University of Paris Ouest Nanterre**), Jean-Marie (**INRIA**, **MAESTRO**), Vliegen (**University of Twente**).

Perfect sampling: Gaujal (**INRIA**, **MESCAL**)

Markov chains: Fourneau (**UVSQ**), Scheller-Wolf (**Carnegie Mellon**).

Bipartite matching: Gupta (**Google**), Mairesse (**CNRS**)

PCA: Mairesse (**CNRS**), Fatès (**INRIA**, **MAIA**).