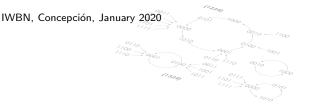
Structure-to-Function Theory for Boolean Networks

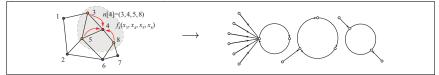
Henning S. Mortveit

Department of Engineering Systems and Environment & NSSAC, Biocomplexity Institute and Initiative University of Virginia



What is Structure-to-Function Theory for BNs?

- ▶ The structure of a Boolean network includes:
 - the vertex functions $(f_i)_{i=1}^n$
 - the update mechanism (e.g., parallel, sequential)
 - the variable dependency graph G (defined by the vertex functions)
- ► Structure-to-function theory for BNs relates the properties of the above components to properties of the associated phase spaces:



► Most of the theory and results shown in this presentation hold for generalizations of BNs (referred to as for example graph dynamical systems/automata networks/polynomial dynamical systems/finite dynamical systems/sequential dynamical systems).

Terminology and Notation: Sequential Graph Dynamical Systems (I)

Structure:

- A (vertex) function sequence $(f_i)_{i=1}^n$ with $f_i : K^n \longrightarrow K$ with K a finite set (for example $K = \{0, 1\}$.)
- A corresponding function sequence $(F_i)_{i=1}^n : K^n \longrightarrow K^n$ defined by

$$F_i(x = (x_1, x_2, \ldots, x_n)) = (x_1, \ldots, x_{i-1}, f_i(x), x_{i+1}, \ldots, x_n)$$

• A permutation
$$\pi = (\pi_1, \ldots, \pi_n) \in S_n$$
.

Definition

The sequential graph dynamical system map $F_{\pi} \colon K^n \longrightarrow K^n$ given by $f = (f_i)_i$ and π is

$$F_{\pi} = F_{\pi_n} \circ F_{\pi_{n-1}} \circ \cdots \circ F_{\pi_2} \circ F_{\pi_1} .$$

Terminology and Notation: Sequential Graph Dynamical Systems II

Definition

The variable dependency graph G of $(f_i)_i$ is the simple graph with vertex set $V(G) = \{1, 2, ..., n\}$ and edge set E(G) all undirected edges $\{i, j\}$ for which f_i depends non-trivially on x_j or f_j depends non-trivially on x_i . The symmetric group on V(G) is denoted by S_G (the set of all permutation update sequences).

Definition

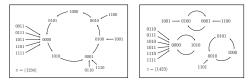
The **phase space** of $F: K^n \longrightarrow K^n$ is the directed graph Γ with vertex set K^n and edge set $\{(x, F(x)) \mid x \in K^n\}$.

Example I: a Structure-to-Function Result for ABNs

▶ Boolean vertex functions $f = (f_i)_{i=1}^4$ defined by (indices modulo 4):

 $f_k(x_1, x_2, x_3, x_4) = \operatorname{nor}_3(x_{k-1}, x_k, x_{k+1}) = (1 + x_{k-1})(1 + x_k)(1 + x_{k+1}) \mod 2$

- Dependency graph G is a square.
- Example phase spaces $\Gamma(F_{\pi})$ with $\pi \in S_G$:



Theorem

For any $\pi \in S_G$ and ABN map F_{π} where each vertex function is a nor-function, $Per(F_{\pi})$ is in a 1-1 correspondence with the set of independent sets of G.

(For $I \in \mathcal{I}$ define $x_I = (x_v)_v$ by $x_v = 1$ if and only if $v \in I$.)

Example II: a Structure-to-Function Result for BNs

Definition (Threshold vertex function)

Let $K = \{0, 1\}$, let $A = (a_{ij})_{i,j=1}^n$ be a real symmetric matrix, let $\theta = (\theta_1, \dots, \theta_n) \in \mathbb{R}^n$, and let $\mathbf{F} = (f_1, \dots, f_n) \colon K^n \longrightarrow K^n$ be the function defined coordinate-wise by

$$f_i(x_1,\ldots,x_n) = egin{cases} 0, & ext{if } \sum\limits_{j=1}^n a_{ij}x_j < heta_i \ 1, & ext{otherwise }. \end{cases}$$

Theorem (Goles & Olivos [1])

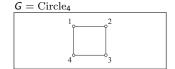
If **F** is a BN map over a graph G where each vertex function is a generalized threshold function as above, then all $x \in \{0, 1\}^n$, are forward asymptotic to a fixed point or a 2-cycle.

Main Presentation Outline

- Setup: will consider a fixed list of vertex function $(f_v)_v$ (and therefore a fixed graph G), and will vary the update sequence $\pi \in S_G$.
- Goals:
 - \blacksquare Demonstrate how one may compare maps F_{π} and $F_{\pi'}$ using various types of comparisons using properties of G
 - Give algorithms for deriving complete sets of update sequence representatives for exploring the diversity of dynamics under the various comparisons (i.e., equivalence notions)
- Comparisons:
 - Functional equivalence identify of maps
 - Dynamical equivalence topological conjugacy of maps
 - Cycle equivalence topological conjugacy of maps restricted to their periodic points
- Associated structures and combinatorics:
 - The set of acyclic orientations of G, denoted by Acyc(G)
 - Toric equivalence \sim_{κ} on Acyc(G) and its set of equivalence classes $Acyc(G)/\sim_{\kappa}$
 - The automorphism group of G, denoted by $\operatorname{Aut}(G)$ (if time permits)

Acyclic Orientations and Functional Equivalence I — Acyc(G)

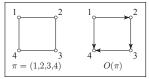
- ▶ Question: for $\pi, \pi' \in S_G$, when is $\mathbf{F}_{\pi} = \mathbf{F}_{\pi'}$?
- ▶ Key insight: $F_4 \circ F_1 \circ F_3 \circ F_2 = F_4 \circ F_3 \circ F_1 \circ F_2$



Definition (\sim_{α} on S_G) Two permutations $\pi, \pi' \in S_G$ are α -related if they differ by exactly one transposition of two consecutive elements π_i and π_{i+1} where { π_i, π_{i+1} } $\notin E(G)$. The equivalence relation \sim_{α} on S_G is the transitive and reflexive closure of the α -relation.

▶ The map $f'_G: S_G \longrightarrow Acyc(G)$ is defined by mapping $\pi \in S_G$ to the acyclic orientation $O(\pi)$ where each edge is oriented according to π (as a linear order.)

 $U(Circle_4)$ (1234) • (2341) $(3412) \bullet$ (4123) (4321) ● ●(3214) (2143) • (1432) (1243) ● (1423) (3241) • (3421) (2134) ● (2314) (4132) • (4312) (1324) • (3124) (2413) • (4213) (4231) $(1342) \bullet \bullet (3142)$ (2431)



Acyclic Orientations and Functional Equivalence II — Acyc(G)

• Let $f = (f_i)_i$. We set $\alpha_f(G) = |\{F_\pi \mid \pi \in S_G\}|$.

Proposition

Let $f = (f_i)_i$ be a function sequence with dependency graph G.

- (i) We have $\pi \sim_{\alpha} \pi'$ implies $F_{\pi} = F_{\pi'}$.
- (ii) The map f'_G extends to a well-defined bijection $f_G \colon S_G/\sim_{\alpha} \longrightarrow \operatorname{Acyc}(X)$ by $[\pi] \stackrel{t_G}{\mapsto} O(\pi)$.
- (iii) We have $\alpha_{nor}(G) = \alpha(G)$.
- ► Implications and results:
 - Nor $_{\pi} = \operatorname{Nor}_{\pi'}$ if and only if $\pi \sim_{\alpha} \pi'$.
 - Have a computationally efficient, graph-based, sufficient condition to guarantee equality of maps F_{π} and $F_{\pi'}$: if $O(\pi) = O(\pi')$ then $F_{\pi} = F_{\pi'}$
 - Can enumerate $\alpha(G)$ through the deletion/contraction recursion relation:

$$\alpha(X) = \alpha(X/e) + \alpha(X \setminus e)$$

Note that $\alpha(G) = T_G(2,0)$. Here T_G is the Tutte polynomial of G. (Remark: the point (2,0) is in the computationally intractable domain (D. Welsh).)

Acyclic Orientations and Functional Equivalence III — Acyc(G)

- ► Summary:
 - Have linked Acyc(G) to functional equivalence of ABN maps F_{π}
 - Have an efficient, sufficent condition to determine if $F_{\pi} = F_{\pi'}$ using $O(\pi)$ and $O(\pi')$
 - The condition is valid for any fixed list of vertex functions $(f_v)_v$ for any state set K (even infinite)
 - Have an upper bound for the number of distinct maps F_{π} that can be constructed by varying π : $\alpha(G) = |\operatorname{Acyc}(G)|$
 - These results are also valid for directed graphs G

Cycle Equivalence

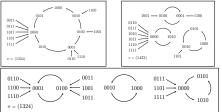
Definition (Cycle Equivalence)

Two maps ϕ and ψ over finite state spaces are *cycle equivalent* if there is a bijection h such that

$$\psi \circ h = h \circ \phi$$

holds when restricted to the periodic points of ϕ . (Or: multi-sets of cycle sizes are equal.)

Example: Nor π for selected permutation update sequences over $G = Circle_4$:



▶ Note: there are 2 distinct cycle structures in the phase spaces above: $\{7(1)\}$ and $\{2(2), 3(1)\}$

Cycle Equivalence I

Theorem (Macauley & Mortveit, Nonlinearity 2009)

Let $f = (f_i)_i$ be a sequence of vertex functions and assume that the state space satisfies $|K| < \infty$. For any permutation $\pi \in S_G$, the maps F_{π} and $F_{\text{shift}(\pi)}$ are cycle equivalent.

Proof idea: $F_1 \circ (F_n \circ \cdots \circ F_2 \circ F_1) = (F_1 \circ F_n \circ \cdots \circ F_2) \circ F_1$.

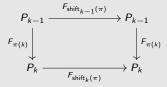
Cycle Equivalence I

Theorem (Macauley & Mortveit, Nonlinearity 2009)

Let $f = (f_i)_i$ be a sequence of vertex functions and assume that the state space satisfies $|K| < \infty$. For any permutation $\pi \in S_G$, the maps F_{π} and $F_{\text{shift}(\pi)}$ are cycle equivalent.

Proof idea: $F_1 \circ (F_n \circ \cdots \circ F_2 \circ F_1) = (F_1 \circ F_n \circ \cdots \circ F_2) \circ F_1$.

Set $P_k = \operatorname{Per}(F_{\operatorname{shift}_k(\pi)})$. The diagram



commutes for all $1 \le k \le n$, and $F_{\pi(k)}(P_{k-1}) \subset P_k$. The restriction map $F_{\pi(k)} \colon P_{k-1} \longrightarrow F_{\pi(k)}(P_{k-1})$ is an injection, so $|P_{k-1}| \le |P_k|$ and

$$|\operatorname{Per}(F_{\pi})| \leq |\operatorname{Per}(F_{\operatorname{shift}_1(\pi)})| \leq \cdots \leq |\operatorname{Per}(F_{\operatorname{shift}_{n-1}(\pi)})| \leq |\operatorname{Per}(F_{\pi})|$$
.

All inequalities are equalities, and since the graph and state space are finite, all the restriction maps $F_{\pi(k)}$ are bijections.

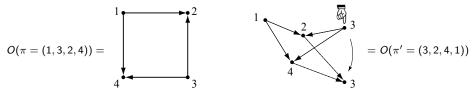
Cycle Equivalence I

Cycle Equivalence - III

▶ Observation 1: if two permutations $\pi, \pi' \in S_G$ differ by (*i*) a sequence of consecutive, non-adjacent transpositions and (*ii*) cyclic shifts, then F_{π} and $F_{\pi'}$ are cycle equivalent. If π, π' are related in this manner, then we say they are *torically equivalent*.

▶ Observation 2: toric equivalence of permutations is succinctly captured through sequences of *source-to-sink conversions* of acyclic orientations.

► Example:



Definition (Toric equivalence \sim_{κ} on Acyc(G))

For acyclic orientations $O, O' \in Acyc(G)$ we say that O is κ -related to O' if O can be converted to O' by converting exactly one source vertex $v \in G$ of O to a sink. The *toric equivalence* relation \sim_{κ} on Acyc(G) is the transitive- and reflexive closure of the κ -relation.

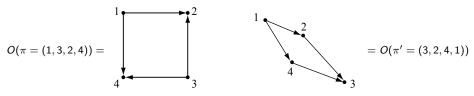
Cycle Equivalence I

Cycle Equivalence - III

▶ Observation 1: if two permutations $\pi, \pi' \in S_G$ differ by (*i*) a sequence of consecutive, non-adjacent transpositions and (*ii*) cyclic shifts, then F_{π} and $F_{\pi'}$ are cycle equivalent. If π, π' are related in this manner, then we say they are *torically equivalent*.

▶ Observation 2: toric equivalence of permutations is succinctly captured through sequences of *source-to-sink conversions* of acyclic orientations.

► Example:



Definition (Toric equivalence \sim_{κ} on Acyc(G))

For acyclic orientations $O, O' \in Acyc(G)$ we say that O is κ -related to O' if O can be converted to O' by converting exactly one source vertex $v \in G$ of O to a sink. The *toric equivalence* relation \sim_{κ} on Acyc(G) is the transitive- and reflexive closure of the κ -relation.

Combinatorics and Dynamics Related to Toric Equivalence

- We set $\kappa(G) = |\operatorname{Acyc}(G)/\sim_{\kappa}|$, the number of toric equivalence classes.
- ▶ By the previous theorem, $\kappa(G)$ is an upper bound for the number of distinct cycle structure that one can generate by maps of the form F_{π} for a fixed sequence $(f_v)_v$.

Theorem (Macauley & Mortveit, Proc. AMS.)

 $\kappa(G) = \begin{cases} \kappa(G_1)\kappa(G_2), & e \text{ is a bridge linking } G_1 \text{ and } G_2, \\ \kappa(G/e) + \kappa(G \setminus e), & e \text{ is a cycle-edge}. \end{cases}$

Corollary (Macauley & Mortveit)

Let $f = (f_i)_i$ be a sequence of vertex functions whose dependency graph G is a tree. Then all maps F_{π} have the same periodic orbit structure.

• Because: for a tree G we have $\kappa(G) = 1$.

Example (Enumerations)

Let $G = Q_2^3$, the binary 3-cube for which $|S_G| = 8! = 40320$.

$$\kappa(\checkmark) = \kappa(\checkmark) + \kappa(\checkmark) = \kappa(\checkmark) + 2\kappa(\checkmark) + \kappa(\checkmark)$$
$$= \kappa(\checkmark) + 2\kappa(\checkmark) + \kappa(\checkmark) + \kappa(\checkmark)$$
$$= \kappa(\checkmark) + 4\kappa(\checkmark) + 2\kappa(\checkmark) + \kappa(\checkmark) + \kappa(\checkmark)$$
$$= 27 + 64 + 16 + 12 + 14 = \boxed{133}$$

• Can show in a similar way that $\alpha(Q_2^3) = |\operatorname{Acyc}(Q_2^3)| = 1862$.

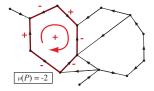
- ▶ Moreover, we have $\delta(G) = 67$ and $\overline{\alpha}(G) = 54$ and $\overline{\kappa}(Q_2^3) = 8$, but that is for another talk.
- ▶ All bounds, as they pertain to dynamics, are attained for using vertex functions $(nor_i)_i$.

Determining if $\pi \sim_{\kappa} \pi'$ — Coleman's ν -function

▶ Let $P = (v_1, v_2, ..., v_k)$ be a (possibly closed) simple path in G. The map

 $\nu_P \colon \operatorname{Acyc}(G) \longrightarrow \mathbb{Z}$

is defined by $\nu_P(O) = n_P^+(O) - n_P^-(O)$ where n_P^+ (resp. $n_P^-)$ is the number of edges of the form $\{v_i, v_{i+1}\}$ in G oriented as (v_i, v_{i+1}) (resp. (v_{i+1}, v_i)) in O.



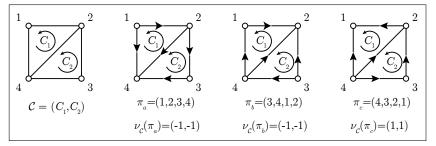
Lemma

Let C be a simple, closed path in the simple graph G. The map ν_{C} induces a map ν_{C}^{*} : $\operatorname{Acyc}(G)/\sim_{\kappa} \longrightarrow \mathbb{Z}$.

Determining if $\pi \sim_{\kappa} \pi'$, thus implying that F_{π} and $F_{\pi'}$ are cycle equivalent.

Proposition (Macauley & Mortveit, EJC.)

Let $C = (C_1, \ldots, C_m)$ be a cycle basis of G. Extended to C, the function ν_C^* is complete invariant for κ -equivalence



- ► Implications:
 - The map $\nu_{\mathcal{C}}^*$ provides a computationally efficient method to assess if $\pi \sim_{\kappa} \pi'$, and in turn:
 - We have a computationally efficient, graph/sequence-based, sufficient condition to test if F_{π} and $F_{\pi'}$ are cycle equivalent.

Constructing a complete phase space atlas for cycle structures

Proposition (Macauley & Mortveit, Proc. AMS)

Let $\operatorname{Acyc}_{v}(G)$ be the subset of $\operatorname{Acyc}(G)$ consisting of all elements where the vertex v is the unique source. For any fixed vertex v of a connected graph G, there is a bijection

 $\phi_{\nu} \colon \operatorname{Acyc}_{\nu}(G) \longrightarrow \operatorname{Acyc}(G)/\sim_{\kappa}$.

► Cycle Structure Atlas Recipe. [Mortveit and Pederson, Math. Bull. 2019 [2]] Constructing all possible cycle structures for maps F_{π} under fixed vertex functions $(f_v)_v$.

- Pick a vertex v of maximal degree, and construct $Acyc_v(G)$.
- For each $O \in \operatorname{Acyc}_{v}(G)$ pick a permutation representative π (using for example $f_{G}^{-1}(\operatorname{Acyc}_{v}(G))$).
- Determine the cycle structure of F_{π} .
- ▶ Have Python code for the above computations (see [2]):

git@github.com:HenningMortveit/gds-framework-python.git,

Example: gene-regulatory network for Arabidopsis thaliana

- ► Computational scaling of previous algorithm: how large networks can be handled?
- ▶ In practice, many application networks (e.g., biological) contain "parameter vertices" or are asymoptotically fixed.
- ▶ Illustration: Model from Demongeot et al. [3]; considers 12 genes and their associated regulatory network for the plant *Arabidopsis thaliana*
- \blacktriangleright Model class: generalized, binary, threshold GDS (same as earlier, but using their notation here)
- $W = [W_{ij}] \in \mathbb{R}^{n \times n}$ matrix of weights
- ▶ $\theta = [\theta_i] \in \mathbb{R}^n$ vector of *thresholds*
- ▶ GDS $F: K^n \longrightarrow K^n$ defined by (*H* the Heaviside step function):

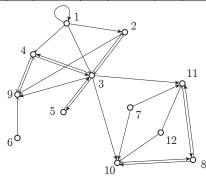
$$\left(F(x)\right)_{i} = H\left(\left(\sum_{j} w_{ij}x_{j}\right) - \theta_{i}\right)$$
(1)

► Goal: investigate the dynamical diversity of attractors for the asynchronous update scheme using permuations.

Example: gene-regulatory network for Arabidopsis thaliana

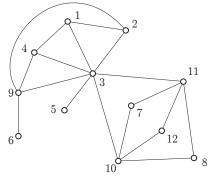
▶ Translation table from gene name (abbrvs.) to integers:

Abbrv.	ID	Abbrv.	ID	Abbrv.	ID	Abbrv.	ID
EMF1	1	TFL1	2	LFY	3	AP1	4
CAL	5	LUG	6	UFO	7	BFU	8
AG	9	AP3	10	PI	11	SUP	12



Example: gene-regulatory network for Arabidopsis thaliana

► Associated combinatorial graph (theory is identical):

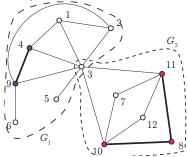


- $\kappa(G) = \kappa(G_1)(G_2) = (2^4 2) \times (2^4 1) = 210$
- ▶ Thus: at most 210 distinct attractor structures (compare to 12! = 479,001,600
- ► This holds for any choice of vertex functions.
- ▶ However, for the specific choice here we can do more.

Outline of proof - Case 2 References

Example: gene-regulatory network for Arabidopsis thaliana

▶ By the particular form of the GDS map H (i.e. the matrix W) many states will be fixed on attractors. For each choice of initial value for $x_1 = x_1(0)$ we obtain the following simplified graph (induced by colored vertices):



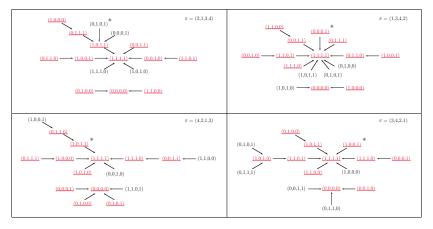
▶ The highlighted subgraph is a tree, so its κ -value is 1. Taking into account the two possible initial values for x_1 we therefore conclude that there are at most 2 attractor structures for this network under sequential update schemes.

▶ Quiz: What do the cycle structures look like?

Beyond Cycle Structure: Toric Equivalence and Transient Structure I

► The map F_{π_1} : $\Gamma_{F_{\pi}} \longrightarrow \Gamma_{F_{\sigma_1}(\pi)}$ is a graph morphism mapping each edge $(x, F_{\pi}(x)) \in \Gamma_{F_{\pi}}$ to the edge $(F_{\pi_1}(x), F_{\pi_1}(F_{\pi}(x))) \in \Gamma_{F_{\sigma_1}(\pi_1)}$.

▶ **Example:** the graph is Circle₄ with vertex set {1,2,3,4} plus the additional diagonal edge {1,3}; Each vertex function is a bi-threshold functions with $k^{\uparrow} = 1$ and $k^{\downarrow} = 3$.



Outline of proof - Case 2 References

Beyond Cycle Structure: Toric Equivalence and Transient Structure II

Theorem (Under review.)

Assume that $x = x^{(0)} \in \operatorname{GoE}(F_{\pi})$ with maximal transient path $P_0 = P_{F_{\pi}}(x^{(0)})$ satisfies (i) $F_{\pi}(x) \notin \operatorname{Per}(F_{\pi})$ and (ii) $F_{\pi}^{-1}(F_{\pi}(x)) \subset \operatorname{GoE}(F_{\pi})$. Then (a) the states $x^{(k)} \in K^n$ defined by

$$x^{(k)} = F_{\pi_k} \circ \cdots \circ F_{\pi_1}(x) ext{ in } \Gamma(F_{\sigma_k(\pi)}), \quad ext{with } 0 \leq k \leq n-1 \ ,$$

are all transient states of their respective phase spaces. Moreover, (b) any sequence of maximal transient paths $(P_k)_k$ with P_k containing $x^{(k)}$ satisfies the inequality

$$|\ell(P_k) - \ell(P_0)| \leq 1 ,$$

and (c)

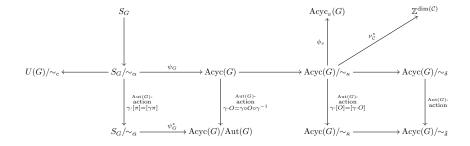
$$\left|\{k \mid \ell(P_k) \neq \ell(P_{k+1})\}\right| \leq 2.$$

Corollary

For each toric equivalence class $[O(\pi)]_{\kappa}$ there exists k such that the maximal transient length $\ell_{\max}(F_{\pi})$ satisfies $k - 1 \leq \ell_{\max}(F_{\pi}) \leq k$.

Outline of proof - Case 2 References

Summary: Equivalences of Maps F_{π} and Overview of Structures



Collaborators and acknowledgments

- ▶ Work presented has been done in collaboration with many people over years.
 - Abhijin Adiga (UVA)
 - Chris L. Barrett (UVA)
 - Ricky Chen (UVA)
 - Eric Goles (Adolfo Ibáñez University)
 - Abdul Jarrah (American University of Sharjah)
 - Reinhard Laubenbacher (U. Conn.)
 - Matthew Macauley (Clemson)
 - Joseph McNitt (VT)
 - David Murrugarra (U. Kentucky)
 - Madhav V. Marathe (UVA)
 - Marco Montalva-Medel (Adolfo Ibáñez University)
 - Ryan Pederson (UCLA-Irvine)
 - Christian M. Reidys (UVA)
- ▶ Thanks to organizers for the invitation and opportunity

► Thanks to collaborators and members of NSSAC at the Biocomplexity Institute and Initiative at UVA. This work has been partially supported by many grants, most recently DTRA R&D Grant HDTRA1-09-1-0017, DTRA Grant HDTRA1-11-1-0016, DTRA CNIMS Contract HDTRA1-11-D-0016-0001.

References I



E. Goles and J. Olivos.

Comportement periodique des fonctions a seuil binaires et applications. *Discrete Applied Mathematics*, 3:93–105, 1981.



Henning S. Mortveit and Ryan D. Pederson. Attractor stability in finite asynchronous biological system models. *Bulletin of Mathematical Biology*, pages 1–23, 2019. Published electronically.



Jacques Demongeot, Eric Goles, Michel Morvan, Mathilde Noual, and Sylvain Sené. Attraction basins as gauges of robustness against boundary conditions in biological complex systems.

PLoS ONE, 5(8):e11793, aug 2010.



Matthew Macauley and Henning S. Mortveit. Cycle equivalence of graph dynamical systems. *Nonlinearity*, 22(2):421–436, 2009. math.DS/0709.0291.

Matthew Macauley, Jon McCammond, and Henning S. Mortveit. Order independence in asynchronous cellular automata. *Journal of Cellular Automata*, 3(1):37–56, 2008. math.DS/0707.2360.

Outline of proof - Case 2 References

References II



Matthew Macauley and Henning S. Mortveit. On enumeration of conjugacy classes of Coxeter elements. *Proceedings of the American Mathematical Society*, 136(12):4157–4165, 2008. math.CO/0711.1140.



Henning S. Mortveit and Christian M. Reidys. *An Introduction to Sequential Dynamical Systems.* Universitext. Springer Verlag, 2007.

Anders Björner and Francesco Brenti. *Combinatorics of Coxeter Groups*, volume 231 of *GTM*. Springer Verlag, 2005.

Matthew Macauley and Henning S. Mortveit. Posets from admissible coxeter sequences. *The Electronic Journal of Combinatorics*, 18(P197), 2011. Preprint: math.DS/0910.4376.