

# LOCAL CYCLES AND DYNAMICAL PROPERTIES OF BOOLEAN NETWORKS

Paul Ruet

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Computational Methods for Systems and Synthetic Biology

## OUTLINE

1. Boolean networks, attractors, interaction graphs, subnetworks
2. Dynamics and structure, Thomas' rules
3. Classes of networks: cycles, and-nets, non-expansive networks...
4. Generalized discrete networks

	definition	function
DNA	long double-helix chain of ( $\approx 10^9$ ) pairs of nucleotides A, T, C, G (Watson-Crick) organized in chromosomes (or circular)	programme
RNA	short chain of ( $\approx 10^3$ ) nucleotides A, U, C, G	product of transcription (messenger RNA), translation (transfer RNA, ribosomal RNA): machines
Proteins	polymers ( $10 - 10^3$ ) made of 22 amino acids	transcription, translation, catalysis (enzymes), transport, intra- and inter-cellular communication, replication, membrane: machines, structure
Sugars, acids,...		ressources-products, structure
Lipids		membrane: structure
Water		structure



# BOOLEAN NETWORKS

Discrete dynamical systems

Each of  $n$  agents takes 2 values (states) 0, 1. State space  $\{0, 1\}^n$

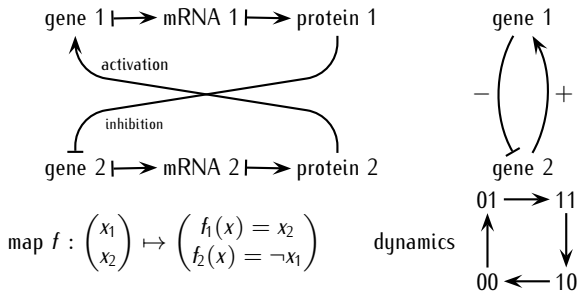
Models of, e.g., neural (McCulloch–Pitts), genetic (Kauffman, Thomas...) networks

Gene networks: abstraction of regulatory transcription / translation processes

Agents  $1, \dots, n =$  genes,  $x_i =$  discretized expression level of gene  $i$

Motivations:

1. qualitative nature of biological questions
2. in vivo measurements capabilities
3. many non-linear (sigmoid-shaped) interactions with strong threshold effects



## BOOLEAN NETWORKS

**Notation.**  $\mathbb{F}_2$  is the two-element field, with sum  $+$  (xor). The canonical basis of the vector space  $\mathbb{F}_2^n$  is  $\{e^1, \dots, e^n\}$ , and for each  $I \subseteq \{1, \dots, n\}$ ,  $e^I = \sum_{i \in I} e^i$ . We may remove brackets and write  $e^{1,2}$  for  $e^{\{1,2\}}$ . For  $x, y \in \mathbb{F}_2^n$ ,  $d(x, y)$  is the Hamming distance (cardinality of the unique subset  $I \subseteq \{1, \dots, n\}$  such that  $x + y = e^I$ ).

**Definition.** A **Boolean network** is a map from  $\mathbb{F}_2^n$  to  $\mathbb{F}_2^n$ .

**Definition.** The **synchronous dynamics (iteration)** associated to a Boolean network  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$  is the directed graph with vertex set  $\mathbb{F}_2^n$  and an edge from  $x$  to  $f(x)$  for all  $x$ .

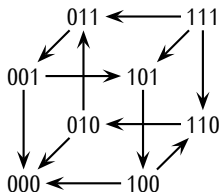
**Definition.** The **asynchronous dynamics** associated to  $f$  is the directed graph  $\Gamma(f)$  with vertex set  $\mathbb{F}_2^n$  and an edge from  $x$  to  $y$  when for some  $i$ ,  $y = x + e^i$  and  $f_i(x) \neq x_i$ .

**Example.**

Boolean network

$$x \mapsto \begin{pmatrix} (x_2 + 1)x_3 \\ (x_3 + 1)x_1 \\ (x_1 + 1)x_2 \end{pmatrix}$$

asynchronous dynamics



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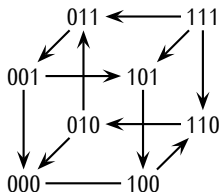
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$x \mapsto \dots$

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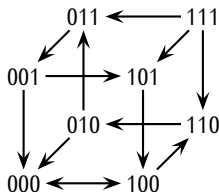
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asynchronous dynamics





**Proposition.**  $\Gamma$  is a bijection between maps from  $\mathbb{F}_2^n$  to  $\mathbb{F}_2^n$  and partial orientations of the hypercube  $\mathbb{F}_2^n$ .

**Proofs.** Cf notes (and blackboard).

**Remarks.**

1. The synchronous dynamics is deterministic, the asynchronous dynamics non-deterministic.
2. Informal justification of asynchrony: trajectories of (piecewise-linear) differential equation models a.s. cross 1 threshold hyperplane at a time  $\Rightarrow$  1 variable update at a time.

**Definition.** Both dynamics agree on **fixed points**. A **trajectory** is a path in  $\Gamma(f)$ . An **attractor** is a terminal strongly connected component of  $\Gamma(f)$ . A **cyclic attractor** is an attractor which is not a singleton (*i.e.* does not consist in a fixed point). An **attractive cycle** is a cyclic trajectory  $\theta$  such that for each point  $x \in \theta$ ,  $d(x, f(x)) = 1$ . The **antipode** of  $x \in \mathbb{F}_2^n$  is  $\bar{x} = x + e^{1, \dots, n}$ . **Antipodal** attractive cycles are those of the form

$$(x^1, \dots, x^n, x^{n+1}, \dots, x^{2n}, x^1) = (x^1, \dots, x^n, \bar{x}^1, \dots, \bar{x}^n, x^1).$$

### Remarks.

1. If  $f$  has no fixed point, then  $\Gamma(f)$  has a cyclic attractor.
2. Attractive cycles are examples of cyclic attractors.
3. In an antipodal attractive cycle as above,  $d(x^i, x^{i+n}) = n$  for each  $i \in \{1, \dots, n\}$ .

**Definition.** A network  $f$  is **weakly terminating** if for any  $x \in \mathbb{F}_2^n$ ,  $\Gamma(f)$  has a trajectory from  $x$  to a fixed point, **directly terminating** if moreover such a trajectory exists in which the distance to the fixed point decreases, and **collapsing** if it is directly terminating to a unique fixed point.

**Remark.** Weak termination is equivalent to the absence of cyclic attractor.

# ATTRACTORS

## Example.

fixed point

cyclic trajectory

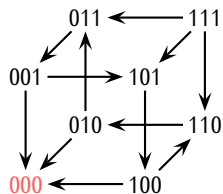
attractive cycle

cyclic attractor

weak termination

direct termination

collapse



yes

# ATTRACTORS

## Example.

fixed point

cyclic trajectory

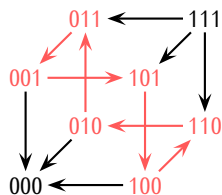
attractive cycle

cyclic attractor

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direct termination

collapse



# ATTRACTORS

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cyclic trajectory

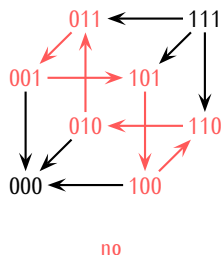
attractive cycle

cyclic attractor

weak termination

direct termination

collapse



# ATTRACTORS

## Example.

fixed point

cyclic trajectory

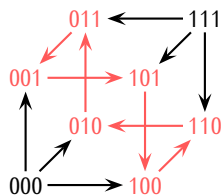
attractive cycle

cyclic attractor

weak termination

direct termination

collapse



yes

# ATTRACTORS

## Example.

fixed point

cyclic trajectory

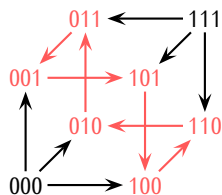
attractive cycle

cyclic attractor

weak termination

direct termination

collapse



yes

# ATTRACTORS

## Example.

fixed point

cyclic trajectory

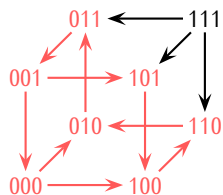
attractive cycle

cyclic attractor

weak termination

direct termination

collapse



yes



# ATTRACTORS

## Example.

fixed point

cyclic trajectory

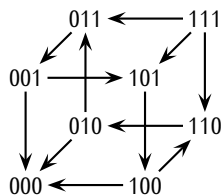
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weak termination

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collapse

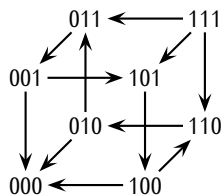


yes

# ATTRACTORS

## Example.

fixed point  
cyclic trajectory  
attractive cycle  
cyclic attractor  
weak termination  
direct termination  
collapse



yes

# ATTRACTORS

## Example.

fixed point

cyclic trajectory

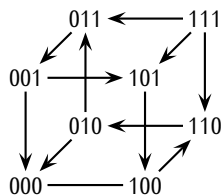
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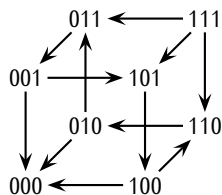


no

# ATTRACTORS

## Example.

fixed point  
cyclic trajectory  
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collapse



yes

**Definition.** Given  $\varphi : \mathbb{F}_2^n \rightarrow \mathbb{F}_2$  and  $i \in \{1, \dots, n\}$ , the **discrete  $i^{\text{th}}$  partial derivative**  $\partial\varphi/\partial x_i = \partial_i\varphi : \mathbb{F}_2^n \rightarrow \mathbb{F}_2$  maps each  $x \in \mathbb{F}_2^n$  to

$$\partial_i\varphi(x) = \varphi(x) + \varphi(x + e^i).$$

Given  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$  and  $x \in \mathbb{F}_2^n$ , the **discrete Jacobian matrix**  $\mathcal{J}(f)(x)$  is the  $n \times n$  matrix with entries  $\mathcal{J}(f)(x)_{i,j} = \partial_j f_i(x)$ .

**Remarks.**

1.  $\partial_i\varphi(x) = 1$  if and only if  $\varphi(x) \neq \varphi(x + e^i)$ . In that case, the influence of variable  $x_i$  on  $\varphi$  at  $x$  is either covariant when the map

$$\mathbb{F}_2 \rightarrow \mathbb{F}_2, \alpha \mapsto \varphi(x_1, \dots, x_{i-1}, \alpha, x_{i+1}, \dots, x_n)$$

is increasing (identity), or contravariant when it is decreasing (negation).

2. Variant of Leibniz rule:  $\partial_i(\varphi\psi) + \partial_i\varphi\partial_i\psi = \varphi\partial_i\psi + \psi\partial_i\varphi$ .

**Definition.** A **signed directed graph** is a directed graph with a sign,  $+1$  or  $-1$ , attached to each edge. The **sign** of a cycle (or more generally of a path) is the product of the signs of its edges.

**Remark.** All cycles will be assumed to be directed and elementary.

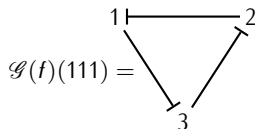
**Definition.** The **interaction graph**  $\mathcal{G}(f)(x)$  of  $f$  at  $x$  is the signed directed graph on vertex set  $\{1, \dots, n\}$  which has an edge from  $j$  to  $i$  when  $\mathcal{J}(f)(x)_{i,j} = 1$ , with positive (resp. negative) sign when the influence of  $x_j$  on  $f_i$  is covariant (resp. contravariant). The **global interaction graph**  $\mathcal{G}(f)$  has the same vertices, and a positive (resp. negative) edge from  $j$  to  $i$  when for some  $x$ ,  $\mathcal{G}(f)(x)$  has. A cycle, or more generally a path, of  $\mathcal{G}(f)$  is said to be **local** when it lies in  $\mathcal{G}(f)(x)$  for some  $x$ .

## Remarks.

1. The condition for an edge to be positive in  $\mathcal{G}(f)(x)$  is equivalent to  $x_j = f_i(x)$ .
2. A global interaction graph may have two edges of opposite signs from some vertex to another.
3.  $\mathcal{J}(f)(x)$  is the adjacency matrix of the transpose of (the graph underlying)  $\mathcal{G}(f)(x)$ .

## Example.

$$f(x) = \begin{pmatrix} (x_2 + 1)x_3 \\ (x_3 + 1)x_1 \\ (x_1 + 1)x_2 \end{pmatrix}$$





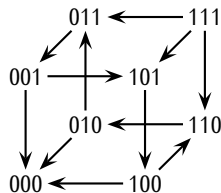
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**Definition.** For any subcube  $\kappa$ , the subnetwork  $f \upharpoonright_{\kappa} : \kappa \rightarrow \kappa$  is defined in the obvious way: if  $\kappa = x[I]$  and  $y \in \kappa$ ,

$$(f \upharpoonright_{\kappa}(y))_i = \begin{cases} f_i(y) & \text{if } i \in I \\ x_i & \text{otherwise.} \end{cases}$$

subcube

subnetwork  $f \upharpoonright_{\kappa} : \kappa \rightarrow \kappa$  of  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$





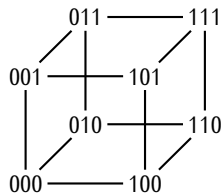
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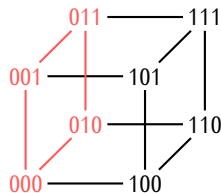
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## SUBNETWORKS

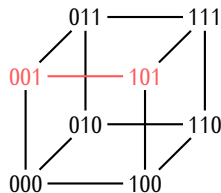
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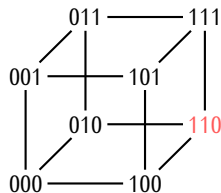
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yes





## SUBNETWORKS

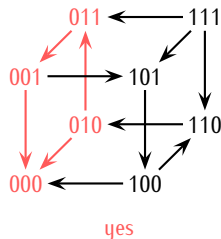
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subcube

**subnetwork**  $f \upharpoonright_{\kappa} : \kappa \rightarrow \kappa$  of  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$



**Proposition.**

1. Compatibility with asynchronous dynamics:  $\Gamma(f|_{\kappa})$  is the subgraph of  $\Gamma(f)$  induced by  $\kappa$ .
2. Compatibility with interaction graphs:  $\mathcal{G}(f|_{\kappa})(y)$  is the signed subgraph of  $\mathcal{G}(f)(y)$  induced by  $I$ .

**Lemma.** If  $f$  has  $\geq 2$  attractors, then some subnetwork  $f|_{\kappa}$  has  $\geq 2$  fixed points.



**Definition.** If  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$  is such that  $\mathcal{G}(f)$  has no loop on  $n$  (no edge  $(n, n)$ ), the **reduced** Boolean network  $f' : \mathbb{F}_2^{n-1} \rightarrow \mathbb{F}_2^{n-1}$  is defined by substitution:

$$f'_i(x) = f_i(x, f_n(x, 0)) = f_i(x, f_n(x, 1))$$

for each  $x \in \mathbb{F}_2^{n-1}$  and  $i < n$ . If  $f$  reduces to  $f'$ , we say that  $f$  is **expanded** from  $f'$ .

### Remarks.

1. The hypothesis on  $\mathcal{G}(f)$  entails  $f_n(x, 0) + f_n(x, 1) = \partial_n f(x, 0) = \partial_n f(x, 1) = 0$ . We shall write  $f'(x) = f(x, f_n(x, -))$ .
2. Generalization: reductions and expansions over any variable(s) can be considered.

**Proposition.** Assume  $\mathcal{G}(f)$  has no loop on  $n$ .

1. Fixed points are preserved by reduction and expansion:  $x$  is a fixed point of  $f'$  if and only if  $(x, f_n(x, -))$  is a fixed point of  $f$ .
2. Attractive cycles are preserved by reduction: the projection  $\pi : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^{n-1}$  maps attractive cycles of  $f$  to attractive cycles of  $f'$ .

**Remark.** Attractive cycles are not preserved by expansion:

$$\begin{pmatrix} x_1 \\ x_2 \\ x_3 \end{pmatrix} \mapsto \begin{pmatrix} x_2 + 1 \\ x_1 \\ x_1 + x_2 \end{pmatrix} \text{ has no attractive cycle, but reduces to } \begin{pmatrix} x_1 \\ x_2 \end{pmatrix} \mapsto \begin{pmatrix} x_2 + 1 \\ x_1 \end{pmatrix}.$$

**Exercise.** Arbitrary cyclic attractors are generally neither preserved by reduction, nor by expansion.

**Rules (René Thomas).**

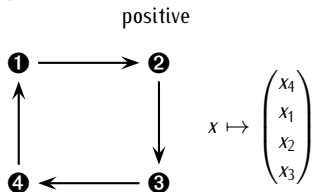
1. Differentiation ( $\geq 2$  fixed points)  $\Rightarrow$  'functional' positive cycle.
2. Homeostasis (sustained oscillations)  $\Rightarrow$  'functional' negative cycle.

Contributions of Aracena, Chaouiya, Comet, Dong, Goles, Ho, Mossé, Naldi, Remy, Richard, Ruet, Shih, Thieffry...

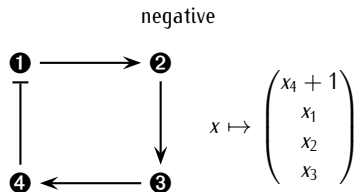
Differential framework: contributions of Demongeot, Gouzé, Snoussi, Soulé...

**Theorem.** If  $\mathcal{G}(f)(x)$  is independent of  $x$  and consists in a Hamiltonian positive (resp. negative) cycle, then  $f$  has 2 fixed points and no cyclic attractor (resp.  $f$  has no fixed point, and a unique attractor which is an attractive cycle).

**Example.**



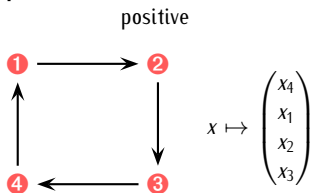
2 fixed points: 0000, 1111  
direct termination (to 0000 and 1111)



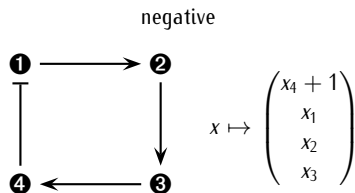
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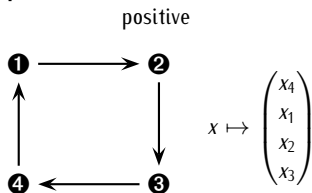
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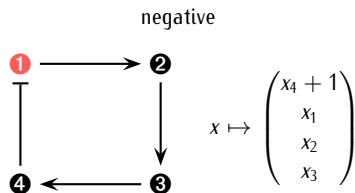
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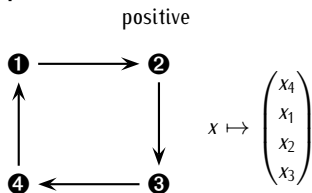
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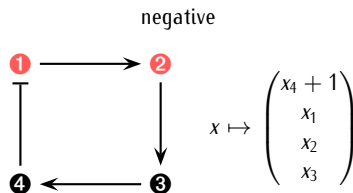
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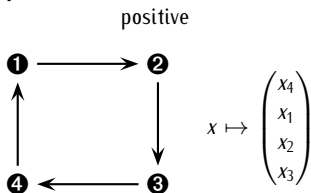
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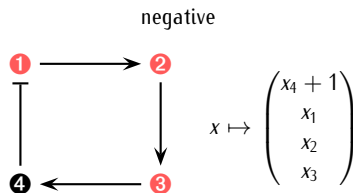
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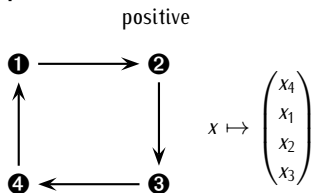


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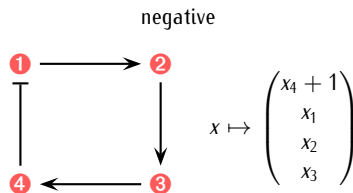


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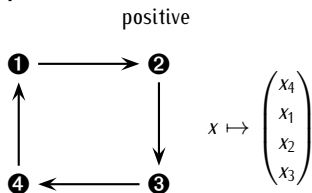
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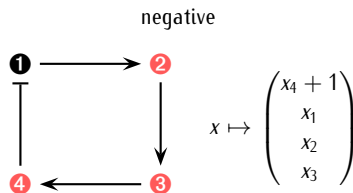
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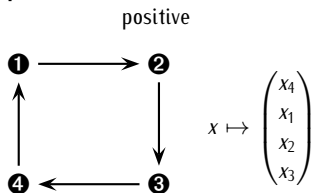
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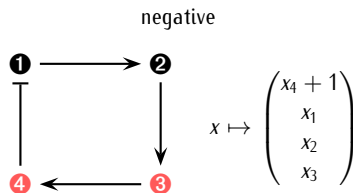
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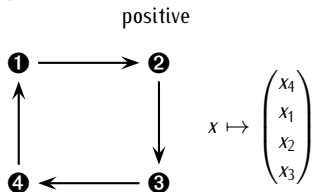
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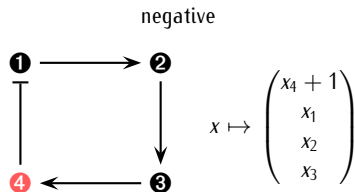
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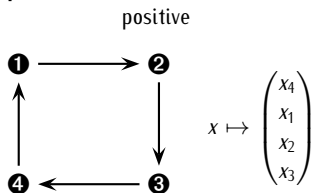
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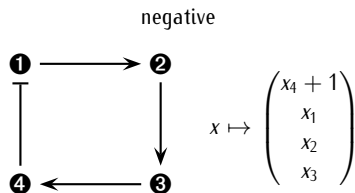
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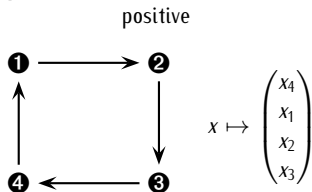
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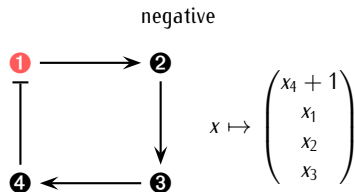
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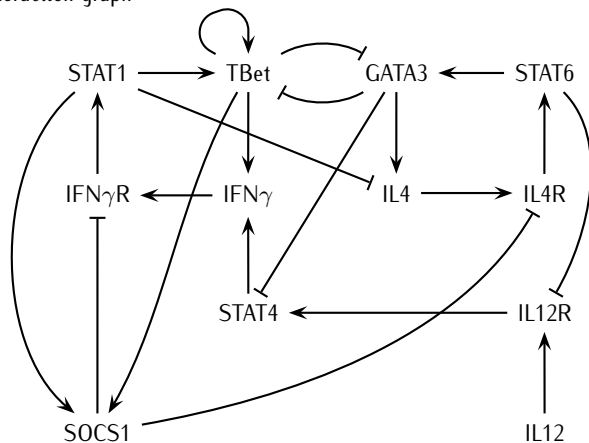
## EXAMPLE: TH LYMPHOCYTE DIFFERENTIATION

**Exercise.** Implement  $f : \mathbb{F}_2^{12} \rightarrow \mathbb{F}_2^{12}$  in GINsim.

index $i$	gene	$f_i(x)$
1	IFN $\gamma$	$x_9 \vee x_{11}$
2	IL4	$x_{12} \wedge \neg x_7$
3	IL12	<b>constant</b>
4	IFN $\gamma$ R	$x_1 \wedge \neg x_{10}$
5	IL4R	$x_2 \wedge \neg x_{10}$
6	IL12R	$x_3 \wedge \neg x_8$
7	STAT1	$x_4$
8	STAT6	$x_5$
9	STAT4	$x_6 \wedge \neg x_{12}$
10	SOCS1	$x_7 \vee x_{11}$
11	TBet	$(x_7 \vee x_{11}) \wedge \neg x_{12}$
12	GATA3	$x_8 \wedge \neg x_{11}$

## EXAMPLE: TH LYMPHOCYTE DIFFERENTIATION

Global interaction graph





**Theorem (Robert).** If  $\mathcal{G}(f)$  has no cycle, then  $f$  has a unique fixed point and the iteration of  $f$  terminates in  $\leq n$  steps.

**Theorem (Bahi-Michel).** If  $\mathcal{G}(f)$  has no cycle, then  $\Gamma(f)$  is collapsing.

**Proofs.** Exercise.

**Theorem.** If  $\mathcal{G}(f)$  has no local cycle, then  $f$  has a unique fixed point.

**Proof.** The group  $\mathbb{F}_2^n$  acts on the set of Boolean networks by translation, and  $\mathcal{J}(f+x)(-) = \mathcal{J}(f)(-)$ .

**Lemma.**

1. An orbit of Boolean networks contains a network with no fixed point if and only if it contains a network with  $\geq 2$  fixed points.
2. The set of networks such that each subnetwork  $f|_{\kappa}$  has a unique fixed point is closed under translation.









**Theorem.** There exists a 4-dimensional Boolean network  $f$  such that  $\mathcal{G}(f)$  has no local cycle and the iteration of  $f$  does not terminate.

The iteration of

$$f(x) = \begin{pmatrix} (x_3 \vee x_4) \neg x_2 \\ x_3 \neg x_4 \\ x_4 \neg x_1 \neg x_2 \\ x_1 x_2 \neg x_3 \end{pmatrix}$$

has a cycle  $((0, 0, 0, 1), (1, 0, 1, 0), (1, 1, 0, 0), (0, 0, 0, 1))$ , but  $\mathcal{G}(f)$  has no local cycle.

**Proof.** GINsim.

**Lemma.** If  $C$  is a cycle of  $\mathcal{G}(f)(x)$  with vertex set  $I$ , then  $C$  is positive (resp. negative) when  $x$  has an even (resp. odd) out-degree in  $\Gamma(f)$ , *i.e.*, when

$$\sum_{i \in I} (x_i + f_i(x)) = 0 \text{ (resp. } 1).$$

In particular, if  $x$  is a fixed point and  $C$  is any cycle in  $\mathcal{G}(f)(x)$ , then  $C$  is positive.

**Theorem.** If  $\mathcal{G}(f)$  has no local positive cycle, then  $f$  has  $\leq 1$  fixed point.

**Theorem.** If  $\mathcal{G}(f)$  has no local positive cycle, then  $f$  has a unique attractor.



**Theorem.** If  $\Gamma(f)$  has an attractive cycle, then  $\mathcal{G}(f)$  has a negative cycle.

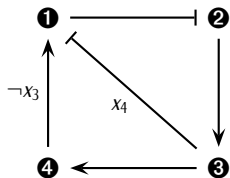
**Lemma.** Let  $p \geq 1$  and  $(x^0, \dots, x^p)$  be a trajectory of  $\Gamma(f)$ . If  $f(x^0) = x^0 + e^i$  and  $f_j(x^p) \neq x_j^p$ , then  $\mathcal{G}(f)$  has a path from  $i$  to  $j$  whose sign is positive if and only if  $x_i^0 = x_j^p$ .

**Theorem.** If  $\Gamma(f)$  has a cyclic attractor (in particular if  $f$  has no fixed point), then  $\mathcal{G}(f)$  has a negative cycle.

**Definition.** A map  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$  is **non-expansive** if  $d(f(x), f(y)) \leq d(x, y)$  for any  $x, y$ .

**Theorem.** If  $f$  is non-expansive and has no fixed point, then  $\mathcal{G}(f)$  has a local negative cycle.

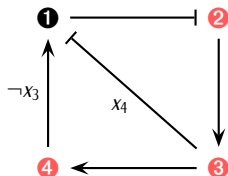
## CHORD IN A CYCLIC BOOLEAN NETWORK



$$f \begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{pmatrix} = \begin{pmatrix} x_4 \overline{x_3} \\ \overline{x_1} \\ x_2 \\ x_3 \end{pmatrix}$$

unique fixed point (0, 1, 1, 1)  
non-attractive cycle

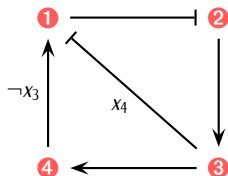
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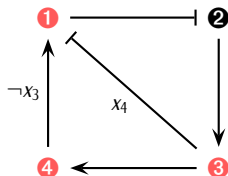
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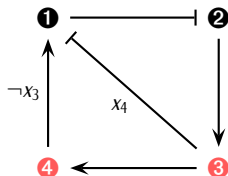
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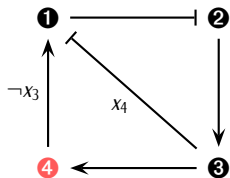
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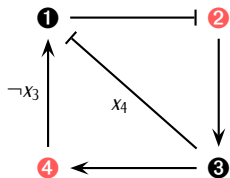
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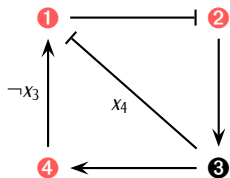


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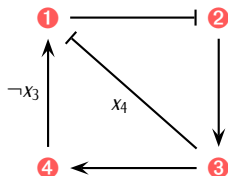
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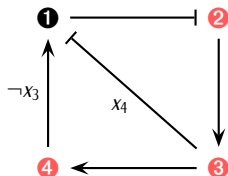
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**Definition.** A network  $f$  is an **and-net** when for each  $i$ ,  $f_i$  is a product of literals, *i.e.* there exist disjoint subsets  $P_i$  and  $N_i$  of  $\{1, \dots, n\}$  such that

$$f_i(x) = \prod_{j \in P_i} x_j \prod_{j \in N_i} (x_j + 1),$$

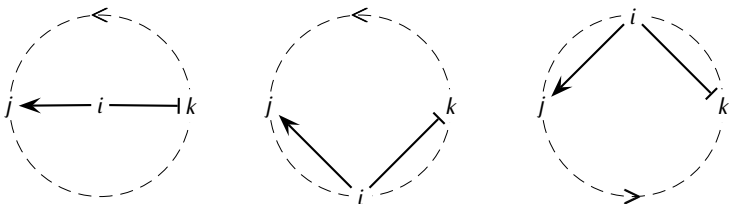
with the convention that the empty product is 1. Indices in  $P_i$  (resp. in  $N_i$ ) are called the positive (resp. negative) **inputs** of  $f_i$ .

### Remarks.

1. The positive (resp. negative) inputs are the vertices  $j$  of  $\mathcal{G}(f)$  such that  $(j, i)$  is a positive (resp. negative) edge of  $\mathcal{G}(f)$ .
2. For an and-net, the global interaction graph  $\mathcal{G}(f)$  determines  $f$ : given a signed directed graph  $G$  which is **simple** (*i.e.* without parallel edges), define the and-net  $f$  by

$$f_i(x) = \prod_{(j,i) \in E^+(G)} x_j \prod_{(j,i) \in E^-(G)} (x_j + 1),$$

where  $E^+(G)$  (resp.  $E^-(G)$ ) is the set of positive (resp. negative) edges of  $G$ . Then  $f$  is the unique and-net such that  $\mathcal{G}(f) = G$ .



**Definition.** A triple  $(i, j, k) \in \{1, \dots, n\}^3$  is said to be a **delocalizing triple** of  $C$  when  $j, k$  are distinct vertices of  $C$  and  $(i, j), (i, k)$  are two edges of  $G$  that are

- ▶ not edges of  $C$ ,
- ▶ and of different signs.

A delocalizing triple  $(i, j, k)$  of  $C$  is said **internal** when  $i$  is a vertex of  $C$ , **external** otherwise.

**Proposition.** For an and-net  $f$ , a cycle  $C$  of  $\mathcal{G}(f)$  is local if and only if it has no delocalizing triple.

**Theorem.**

1. If  $f$  is an and-net and every cycle of  $\mathcal{G}(f)$  has a delocalizing triple, then  $f$  has a unique fixed point.
2. If  $f$  is an and-net and every positive cycle of  $\mathcal{G}(f)$  has a delocalizing triple, then  $f$  has  $\leq 1$  fixed point.

**Theorem.** If  $f$  is an and-net and has an antipodal attractive cycle, then  $\mathcal{G}(f)$  has a local negative cycle.

**Theorem.** If  $f$  is an and-net and every negative cycle of  $\mathcal{G}(f)$  has an internal delocalizing triple, then  $f$  has  $\geq 1$  fixed point.

**Definition.** A vertex  $i$  in a directed graph  $G$  **dominates** a vertex  $j$  when  $G$  has an edge from  $i$  to  $j$ . A set  $I$  of vertices of  $G$  is called **independent** when no edge of  $G$  links two vertices in  $I$ , and **absorbent** when every vertex not in  $I$  dominates some vertex in  $I$ . A **kernel** is an independent and absorbent set of vertices.

**Theorem (von Neumann).** If a directed graph  $G$  has no cycle, then it has a unique kernel.

**Theorem (Boros–Gurvich).** If  $G$  has no even cycle, then it has  $\leq 1$  kernel.

**Theorem (Richardson).** If  $G$  has no odd cycle, then it has  $\geq 1$  kernel.

**Definition.** An and-net  $f$  is **negative** if for all  $i$ ,  $f_i$  has only negative inputs.

**Remark.** Every directed graph  $G$  with vertex set  $\{1, \dots, n\}$  determines a unique negative and-net  $f : \mathbb{F}_2^n \rightarrow \mathbb{F}_2^n$  such that the graph underlying  $\mathcal{G}(f)$  is  $G$ . Positive and negative cycles of  $\mathcal{G}(f)$  correspond to even and odd cycles of  $G$ , where the **parity of a cycle** is the parity of the number of its edges.

**Proposition.** Let  $f$  be the negative and-net associated to the directed graph  $G$ . The fixed points of  $f$  are in bijection with the kernels of  $G^{\text{op}}$  (the opposite of  $G$ , obtained by reversing the direction of edges).





## Theorem.

1. If every cycle of a directed graph  $G$  has a killing triple, then  $G$  has a unique kernel.
2. If every even cycle of  $G$  has a killing triple, then  $G$  has  $\leq 1$  kernel.

**Theorem.** If every odd cycle of  $G$  has an internal killing triple, then  $G$  has  $\geq 1$  kernel.

## Definition.

1. To an and-net  $f$  is associated a directed graph  $f^*$  obtained by replacing positive inputs  $i \rightarrow^+ j$  by  $i \rightarrow^- (i, j) \rightarrow^- j$ , and forgetting signs.
2. To a directed graph  $G$  is associated an and-net  $G^\pm$ .

**Proposition.** The constructions relate fixed points to kernels, positive and negative cycles to even and odd cycles, and (good) delocalizing triples to killing triples.

**Definition.** Let  $X$  be the metric space  $X_1 \times \cdots \times X_n$ , where  $n \geq 1$  and for each  $i$ ,  $X_i = \{m_i, m_i + 1, \dots, M_i\}$  with  $m_i < M_i$ , and distance  $d(x, y) = \sum_i |x_i - y_i|$ . A **discrete asynchronous network** is a directed graph  $\gamma$  with vertex set  $X$  satisfying the following two conditions:

1. if  $\gamma$  has an edge from  $x$  to  $y$ , then  $d(x, y) = 1$ ,
2. for each  $i$ ,  $\gamma$  does not have edges from  $x$  to both  $x + e^i$  and  $x - e^i$ ,

where  $e^i \in X$  is defined by the Kronecker symbol  $e_j^i = \delta_j^i$ . Given  $x, y \in X$ ,  $[x, y]$  is the set of all  $z$  such that  $d(x, y) = d(x, z) + d(z, y)$ , and a **subspace** is a set of the form  $[x, y]$ . For any subspace  $\kappa$ , the **subnetwork**  $\gamma|_\kappa$  is the subgraph of  $\gamma$  induced by  $\kappa$ . The **diameter** of a subspace  $[x, y]$  is  $d(x, y)$ .

**Remark.** The diameter of  $\kappa$  depends only on  $\kappa$ , not on the choice of  $x, y$  such that  $\kappa = [x, y]$ .

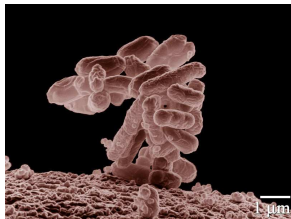
**Definition.** If  $\max_i |x_i - y_i| = 1$  and  $I$  is the set of  $i$  such that  $x_i \neq y_i$ , the map

$$\beta : [x, y] \rightarrow \mathbb{F}_2^I, \quad z \mapsto (z_i - \min(x_i, y_i))_{i \in I}$$

is an increasing bijection, and the **local interaction graph**  $\mathcal{G}(\gamma)(x, y)$  of  $\gamma$  at  $x$  in the **direction of  $y$**  is the interaction graph, at  $\beta(x)$ , of the Boolean network  $\beta(\gamma \upharpoonright_{[x, y]})$  image of the subnetwork  $\gamma \upharpoonright_{[x, y]}$ . The **global interaction graph**  $\mathcal{G}(\gamma)$  has vertex set  $\{1, \dots, n\}$  and a positive (resp. negative) edge from  $i$  to  $j$  when for some  $x, y$  as above,  $\mathcal{G}(\gamma)(x, y)$  has.

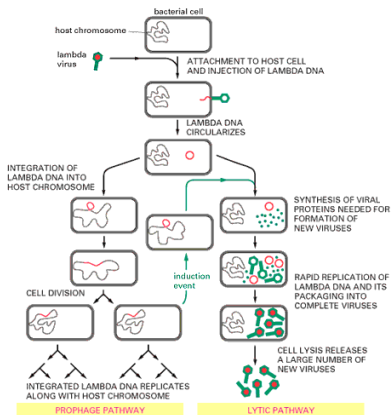
# GENERALIZED DISCRETE NETWORKS: $\lambda$ BACTERIOPHAGE

$\lambda$  is a virus infecting *E. coli* bacteria.



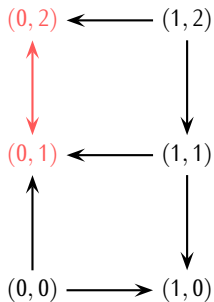
Picture: E. Erbe, C. Pooley

Diagram: *Essential Cell Biology*, Alberts, Bray, Johnson, Lewis, Raff, Roberts, Walter (2009)



# GENERALIZED DISCRETE NETWORKS: $\lambda$ BACTERIOPHAGE

Lytic cycle and lysogenic state

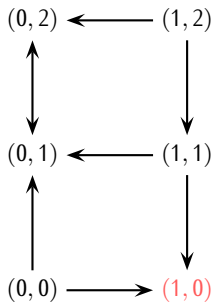


$x_1$ -axis Cl,  $x_2$ -axis Cro



# GENERALIZED DISCRETE NETWORKS: $\lambda$ BACTERIOPHAGE

Lytic cycle and **lysogenic state**

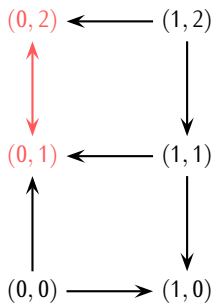


$x_1$ -axis Cl,  $x_2$ -axis Cro



# GENERALIZED DISCRETE NETWORKS: $\lambda$ BACTERIOPHAGE

Lytic cycle and lysogenic state



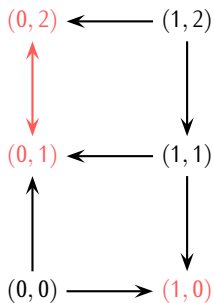
$x_1$ -axis Cl,  $x_2$ -axis Cro





# GENERALIZED DISCRETE NETWORKS: $\lambda$ BACTERIOPHAGE

Lytic cycle and lysogenic state



$x_1$ -axis CI,  $x_2$ -axis Cro



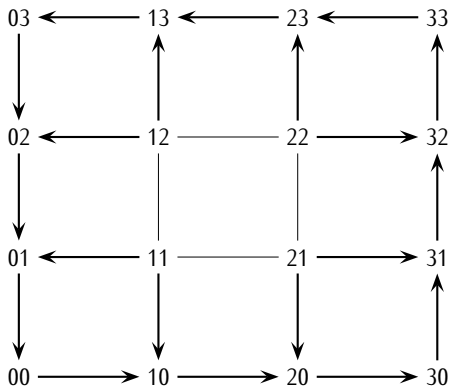
## GENERALIZED DISCRETE NETWORKS: LOCAL CYCLES

**Theorem.** If  $\gamma$  is a discrete network such that  $\mathcal{G}(\gamma)$  has no local positive cycle, then  $\gamma$  has  $\leq 1$  fixed point.

**Theorem.** If  $\gamma$  is a discrete network such that  $\mathcal{G}(\gamma)$  has no local cycle, then  $\gamma$  has a unique fixed point.

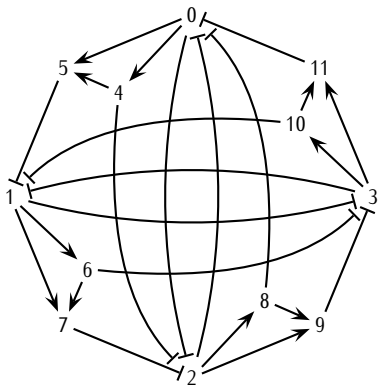
## GENERALIZED DISCRETE NETWORKS

**Theorem.** There exists a 2-dimensional discrete network with no fixed point, an attractive cycle and no local negative cycle.



## BOOLEAN NETWORKS: NEGATIVE CYCLES (CONTINUED)

**Theorem.** There exists a 12-dimensional and-net with no fixed point (hence a cyclic attractor) and no local negative cycle.



**Question.** Does there exist an and-net with an attractive cycle and no local negative cycle?



## BOOLEAN NETWORKS: NEGATIVE CYCLES (CONTINUED)

**Corollary.** Let  $f$  be a negative and-net and  $S$  be the set of negative cycles of  $\mathcal{G}(f)$ . If  $f$  has an  $S$ -quasi-delocalizing function, then  $f$  can be expanded to an and-net without local negative cycle.

**Theorem.** There exists a 7-dimensional Boolean network with an antipodal attractive cycle and no local negative cycle.