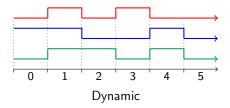
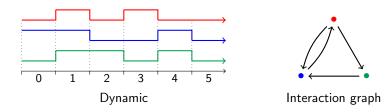
Fixed points and feedback cycles in Boolean networks

Adrien Richard CNRS & Université Côte d'Azur, France

IWBN 2020 Satellite School, January 2020, Concepción, Chile

Adrien Richard



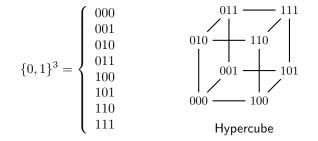


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- \hookrightarrow The variables/components are indexed from 1 to n.
- \hookrightarrow The set of possible <code>states/configurations</code> is $\{0,1\}^n$,

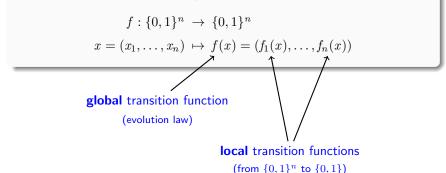
 \hookrightarrow The variables/components are indexed from 1 to *n*. \hookrightarrow The set of possible states/configurations is $\{0, 1\}^n$,

Example with n = 3



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$$f: \{0,1\}^n \to \{0,1\}^n$$
$$x = (x_1, \dots, x_n) \mapsto f(x) = (f_1(x), \dots, f_n(x))$$



$$f: \{0, 1\}^n \to \{0, 1\}^n$$
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The **dynamic** is given by the successive iterations of f:

$$x \to f(x) \to f^2(x) \to f^3(x) \to \cdots$$

$$f: \{0, 1\}^n \to \{0, 1\}^n$$
$$x = (x_1, \dots, x_n) \mapsto f(x) = (f_1(x), \dots, f_n(x))$$

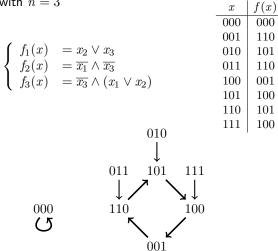
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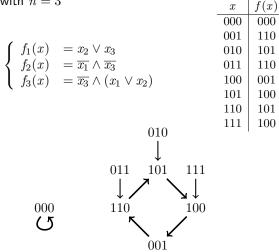
A fixed point is a configuration x such that x = f(x).

fixed points = stable states

Example 1 with n = 3

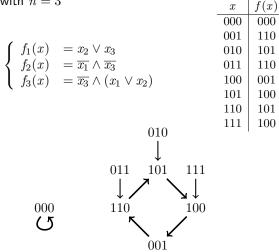


Example 1 with n = 3



Exercise : What is the nb of BNs with *n* components?

Example 1 with n = 3



Exercise : What is the nb of BNs with n components ? $\rightarrow (2^n)^{(2^n)} = 2^{n2^n}$

The signed interaction graph of f is the signed digraph G defined by :

- the set of vertices is $\{1,\ldots,n\}$
- there is a positive arc $j \rightarrow i$ if there is $x \in \{0,1\}^n$ such that

$$f_i(x_1,...,x_{j-1},0,x_{j+1},...,x_n) = 0$$

$$f_i(x_1,...,x_{j-1},1,x_{j+1},...,x_n) = 1$$

- there is a negative arc $j \rightarrow i$ if there is $x \in \{0,1\}^n$ such that

$$f_i(x_1, \dots, x_{j-1}, \mathbf{0}, x_{j+1}, \dots, x_n) = \mathbf{1}$$

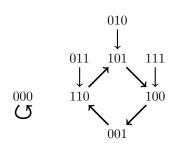
$$f_i(x_1, \dots, x_{j-1}, \mathbf{1}, x_{j+1}, \dots, x_n) = \mathbf{0}$$

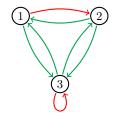
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ſ	$f_1(x)$	$= x_2 \lor x_3$
ł	$f_1(x) \\ f_2(x) \\ f_3(x)$	$=\overline{x_1}\wedge x_3$
l	$f_3(x)$	$=\overline{x_3}\wedge(x_1\vee x_2)$

x	f(x)
000	000
001	110
010	101
011	110
100	001
101	100
110	101
111	100

Dynamic

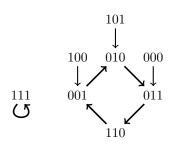


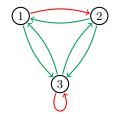


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x	f(x)
000	011
001	010
010	011
011	110
100	001
101	010
110	001
111	111

Dynamic

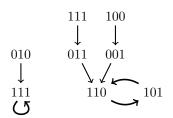


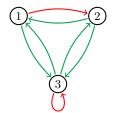


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000	011
001	110
010	111
011	110
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101	110
110	101
111	111

Dynamic

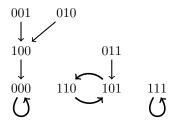


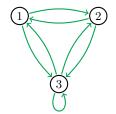


Į	$f_1(x) \\ f_2(x) \\ f_3(x)$	$= x_2 \lor x_3$ $= x_1 \land x_3$
l	$f_3(x)$	$= x_3 \wedge (x_1 \vee x_2)$

x	f(x)
000	000
001	100
010	100
011	101
100	000
101	110
110	101
111	111

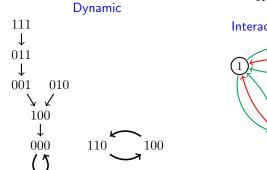
Dynamic





ſ	$f_1(x)$	$= x_2 + x_3$
ł	$f_2(x)$	$= x_1 \wedge x_3$
l	$f_1(x) \\ f_2(x) \\ f_3(x)$	$= x_3 \land (x_1 \lor x_2)$

x	f(x)
000	000
001	100
010	100
011	001
100	000
101	110
110	101
111	011



Interaction graph

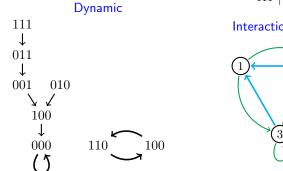
2



3

ſ	$f_1(x)$	$= x_2 + x_3$
ł	$f_2(x)$	$= x_1 \wedge x_3$
l	$f_1(x) \\ f_2(x) \\ f_3(x)$	$= x_3 \land (x_1 \lor x_2)$

x	f(x)
000	000
001	100
010	100
011	001
100	000
101	110
110	101
111	011

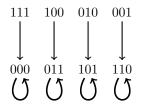


Interaction graph

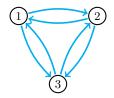
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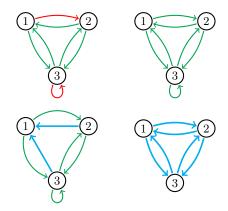
$\int f_1(x)$	$= x_2 + x_3$
$\begin{cases} f_2(x) \end{cases}$	$= x_3 + x_1$
$\int f_3(x)$	$= x_1 + x_2$

Dynamic

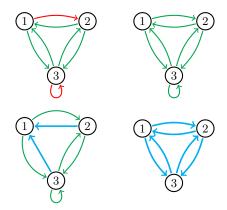


x	$\int f(x)$		
000	000		
001	110		
010	101		
011	011		
100	011		
101	101		
110	110		
111	000		





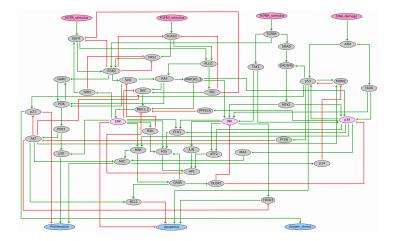
Exercise : What is the nb of signed digraphs with n vertices?



Exercise : What is the nb of signed digraphs with n vertices? $\rightarrow 4^{n^2}$.

- Neural networks [McCulloch & Pitts 1943]
- Gene networks [Kauffman 1969, Thomas 1973]

In the context of gene networks, the first reliable informations often concern the interaction graph



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- Neural networks [McCulloch & Pitts 1943]
- Gene networks [Kauffman 1969, Thomas 1973]

Question

1. What can be said on the **dynamic** of a Boolean network according to its **interaction graph** only?

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Difficult question

 \hookrightarrow the nb of BNs on a given interaction graph G is (generally) **HUGE**.

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13/56

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- $\hookrightarrow \mathbf{2}^{n\mathbf{2}^n}$ Boolean networks with n components
- $\hookrightarrow 4^{n^2}$ interaction graphs with n vertices

 \hookrightarrow the nb of BNs on a *random* interaction graph G is **doubly exponential**.

- Neural networks [McCulloch & Pitts 1943]
- Gene networks [Kauffman 1969, Thomas 1973]

Question

- 1. What can be said on the **dynamic** of a Boolean network according to its **interaction graph** only?
- 2. What can be said on the **nb of fixed points** of a Boolean network according to its **interaction graph** only?

- Neural networks [McCulloch & Pitts 1943]
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Question

- 1. What can be said on the **dynamic** of a Boolean network according to its **interaction graph** only?
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Number of fixed points in the gene network of a multicellular organism

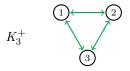
Number of cellular types in the organism

max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G

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$$K_3^+$$
 $(1 \leftrightarrow 2)$
 (3)

max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G



There are 8 possibles BNs on K_3^+ , since

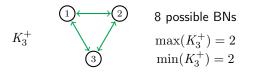
$$f_1(x) = x_2 \wedge x_3 \quad \text{or} \quad f_1(x) = x_3 \vee x_3$$
$$f_2(x) = x_1 \wedge x_3 \quad \text{or} \quad f_2(x) = x_1 \vee x_3$$
$$f_3(x) = x_1 \wedge x_2 \quad \text{or} \quad f_3(x) = x_1 \vee x_2$$

max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G

$$K_3^+$$
 $(1) \longleftrightarrow (2)$
 (3)

x	f(x)	$\int f(x)$	f(x)	f(x)	f(x)	f(x)	f(x)	f(x)
000	000	000	000	000	000	000	000	000
001	000	100	010	110	000	100	010	110
010	000	100	000	100	001	101	001	101
011	100	100	110	110	101	101	111	111
100	000	000	010	010	001	001	011	011
101	010	110	010	110	011	111	011	111
110	001	101	011	111	001	101	011	111
111	111	111	111	111	111	111	111	111

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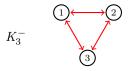
x	f(x)							
000	000	000	000	000	000	000	000	000
001	000	100	010	110	000	100	010	110
010	000	100	000	100	001	101	001	101
011	100	100	110	110	101	101	111	111
100	000	000	010	010	001	001	011	011
101	010	110	010	110	011	111	011	111
110	001	101	011	111	001	101	011	111
111	111	111	111	111	111	111	111	111

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$$K_3^ (1 \leftrightarrow 2)$$

 (3)

max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G



There are 8 possible BNs on K_3^- , since

$$f_1(x) = \overline{x_2} \wedge \overline{x_3} \quad \text{or} \quad f_1(x) = \overline{x_3} \vee \overline{x_3}$$
$$f_2(x) = \overline{x_1} \wedge \overline{x_3} \quad \text{or} \quad f_2(x) = \overline{x_1} \vee \overline{x_3}$$
$$f_3(x) = \overline{x_1} \wedge \overline{x_2} \quad \text{or} \quad f_3(x) = \overline{x_1} \vee \overline{x_2}$$

Adrien Richard

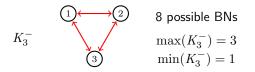
max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G

$$K_3^ (1) \leftrightarrow (2)$$

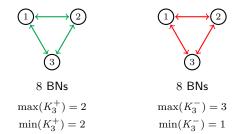
 (3)

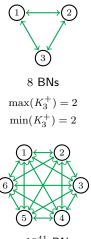
x	f(x)							
000	111	111	111	111	111	111	111	111
001	001	101	011	111	001	101	011	111
010	010	110	010	110	011	111	011	111
011	000	000	010	010	001	001	011	011
100	100	100	110	110	101	101	111	111
101	000	100	000	100	001	101	001	101
110	000	100	010	110	000	100	010	110
111	000	000	000	000	000	000	000	000

max(G) := maximum number of fixed points in a BN on Gmin(G) := minimum number of fixed points in a BN on G



x	f(x)							
000	111	111	111	111	111	111	111	111
001	001	101	011	111	001	101	011	111
010	010	110	010	110	011	111	011	111
011	000	000	010	010	001	001	011	011
100	100	100	110	110	101	101	111	111
101	000	100	000	100	001	101	001	101
110	000	100	010	110	000	100	010	110
111	000	000	000	000	000	000	000	000

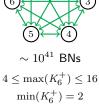


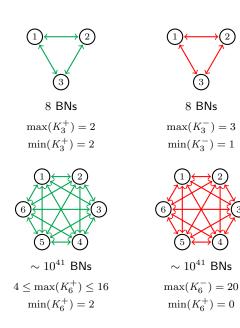




8 BNs

 $\max(K_3^-) = 3$ $\min(K_3^-) = 1$





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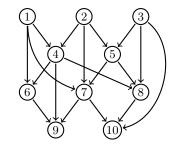
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Outline

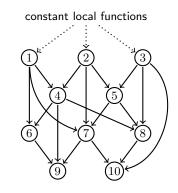
- 1. Absence of cycle
- 2. Positive and negative cycles
- 3. Absence of positive/negative cycle
- 4. Positive feedback bound
- 5. Positive and negative cliques
- 6. The monotone case
- 7. Conclusion

Outline

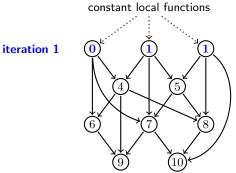
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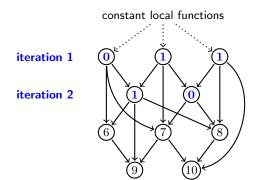
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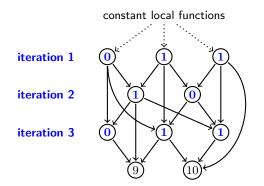


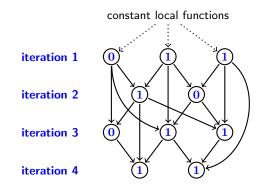


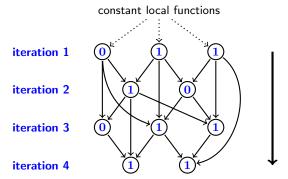




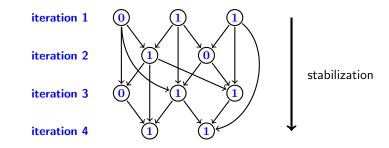








stabilization



Theorem [Robert, 1980] If G is acyclic then f^n is a constant function, thus $\min(G) = \max(G) = 1.$

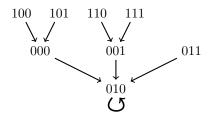
Example 1

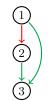
ſ	$f_1(x)$	= 0
{	$f_2(x)$	$=\overline{x_1}$
l	$f_3(x)$	$= x_1 \wedge x_2$

x	f(x)
000	010
001	010
010	010
011	010
100	000
101	000
110	001
111	001

Dynamic







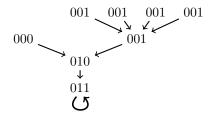
Example 2

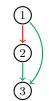
$f_1(x)$	= 0
$f_2(x)$	$=\overline{x_1}$
$f_3(x)$	$= x_1 \vee x_2$
	$egin{array}{l} f_1(x) \ f_2(x) \ f_3(x) \end{array}$

f(x)
010
010
011
011
001
001
001
001









François Robert [1980]

no cycle \Rightarrow "simple" dynamic "complexe" dynamic \Rightarrow cycles

René Thomas [1981] : two type of cycles, positive and negative.

Adrien Richard

1. Positive cycle : even number of negative arcs



2. Negative cycle : even number of negative arcs



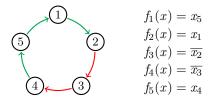
Outline

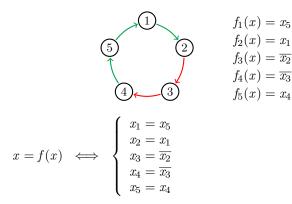
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In a cycle, each vertex i has a unique in-neighbor j, and

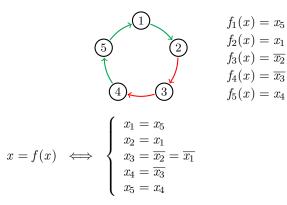
$$f_i(x) = \begin{cases} x_j & \text{if } j \to i \text{ is positive} \\ \overline{x_j} & \text{if } j \to i \text{ is negative} \end{cases}$$

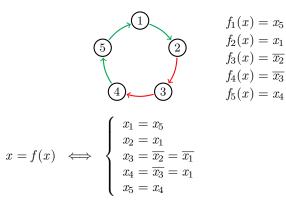
Example



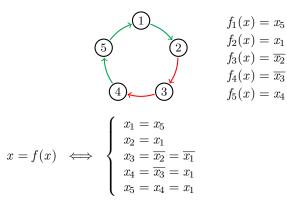


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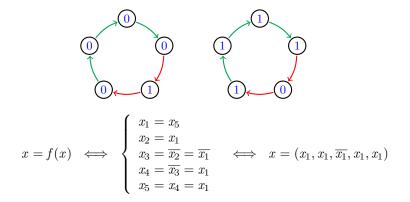
24/56



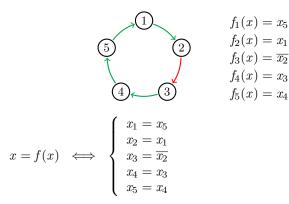
$$x = f(x) \iff \begin{cases} x_1 = x_5 \\ x_2 = x_1 \\ x_3 = \overline{x_2} = x_1 \\ x_3 = \overline{x_2} = \overline{x_1} \\ x_4 = \overline{x_3} = x_1 \\ x_5 = x_4 = x_1 \end{cases} \iff x = (x_1, x_1, \overline{x_1}, x_1, x_1)$$

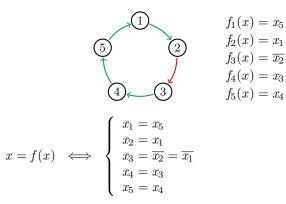
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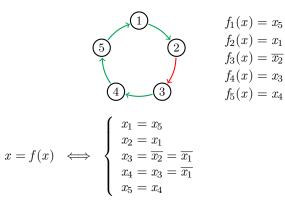
There are exactly two fixed points : 00100 and 11011.

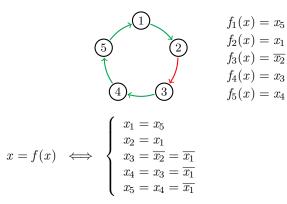


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Fixed points for a negative cycle

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There is no fixed point !

Proposition

1. If G is a positive cycle,

$$\min(G) = \max(G) = 2.$$

1. If G is a negative cycle,

 $\min(G) = \max(G) = 0.$

Outline

- 1. Absence of cycle
- 2. Positive and negative cycles
- 3. Absence of positive/negative cycle
- 4. Positive feedback bound
- 5. Positive and negative cliques
- 6. The monotone case
- 7. Conclusion

Let G be an interaction graph.

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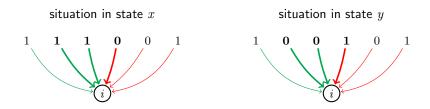
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LOCAL LEMMA



LOCAL LEMMA



Question : Can we compare $f_i(x)$ et $f_i(y)$?

Adrien Richard

LOCAL LEMMA



Question : Can we compare $f_i(x)$ et $f_i(y)$?

Réponse : Yes ! We have $f_i(x) \ge f_i(y)$.

Proof. Let f be a BN on G and let x and y be distinct fixed points of f.

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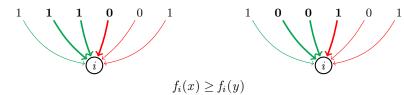
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situation in state y



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30/56

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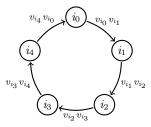
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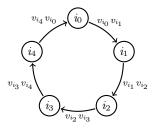
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- 2. If $v_i \neq 0$ then *i* has an in-coming arc $j \rightarrow i$ with sign $v_j v_i$.
- 3. There is a cycle $i_0 i_1 i_2 \dots i_\ell i_0$ where the sign of $i_k \to i_{k+1}$ is $v_{i_k} v_{i_{k+1}}$.



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4. The sign s of this cycle is $s = (v_0v_1) \cdot (v_1v_2) \cdot (v_2v_3) \cdot \ldots (v_\ell v_0) = 1$.

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Let G be an interaction graph.

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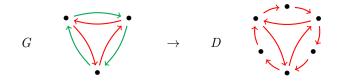
For all
$$x, y \in \{0, 1\}^n$$
, we set $\Delta(x, y) := \{i \in [n] : x_i \neq y_i\}$.

Positive cycle lemma. If x and y are distinct fixed points of f, then

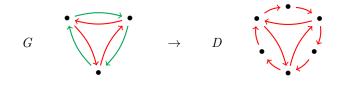
 $G[\Delta(x, y)]$ has a positive cycle.

 \hookrightarrow Reduction to the strongly connected case

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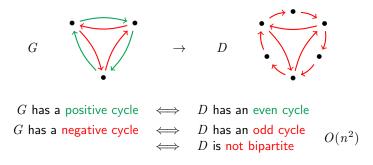


G has a positive cycle G has a negative cycle $\iff D$ has an odd cycle

 \iff D has an even cycle $\iff D$ is not bipartite

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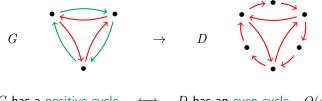
 \hookrightarrow Reduction to the strongly connected case



We can decide in $O(n^2)$ if D is bipartite :

- 1. We take a spanning tree $T \subseteq D$, and a proper 2-coloring c of T.
- 2. *D* is bipartite $\iff c$ is a proper coloring of *D*.

 \hookrightarrow Reduction to the strongly connected case



 $\begin{array}{rcl} G \text{ has a positive cycle} & \Longleftrightarrow & D \text{ has an even cycle} & O(n^d) \\ G \text{ has a negative cycle} & \Longleftrightarrow & D \text{ has an odd cycle} \\ & \Leftrightarrow & D \text{ is not bipartite} & O(n^2) \end{array}$

Theorem [Robertson-Seymour-Thomas, 1999; McCuaig 2004] We can decide in polynomial time if D has an even cycle.

Outline

- 1. Absence of cycle
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7. Conclusion

We have seen that

 $G \text{ acyclic } \Rightarrow G \text{ without positive cycle } \Rightarrow \max(G) \leq 1$

Do we have something of the form

G is not so far from being acyclic $\Rightarrow \max(G)$ is not too large?

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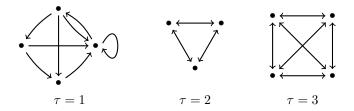
G is not so far from being acyclic $\Rightarrow \max(G)$ is not too large?

How define a distance to acyclicity?

- \hookrightarrow number of cycles ?
- \hookrightarrow min bn of vertices to delete to make the graph acyclic?

- := min size of a set of vertices intersecting every cycle
- := minimum size of a Feedback Vertex Set (FVS)

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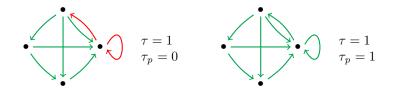
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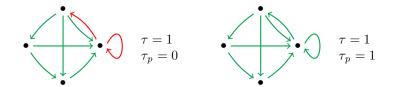
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Remark 1 $au_p \leq au$ (equality when all arcs are positive)

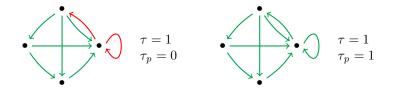
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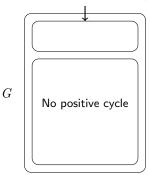
Remark 1 $\tau_p \le \tau$ (equality when all arcs are positive) **Remark 2** τ and τ_p are invariant by subdivisions of arcs

 $\max(G) \le 2^{\tau_p} \le 2^{\tau}$

Adrien Richard

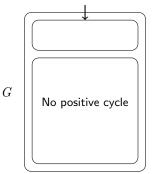
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Positive FVS S of size τ_p



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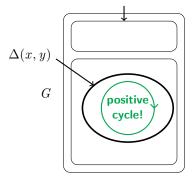
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Let x and y be distinct fixed points.

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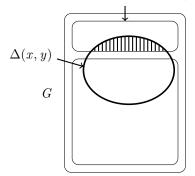
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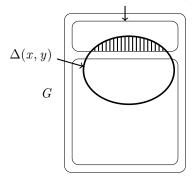
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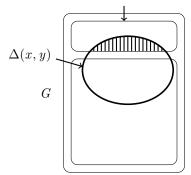
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Thus $|A| \le |\{0,1\}^S| = 2^{\tau_p}$

 $\max(G) \le 2^{\tau_p} \le 2^{\tau}$

Remark G has no positive cycle $\Rightarrow \tau_p = 0 \Rightarrow \max(G) \le 1$

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Remark G has no positive cycle $\Rightarrow \tau_p = 0 \Rightarrow \max(G) \le 1$

This is the only upper bound on max(G) that only depend on the cycle structure

No lower bound on max(G) !

Theorem [Aracena, 2008]

Let G be an interaction graph.

- 1. If G has only positive cycles, then $\min(G) \ge 1$.
- 2. If G has only negative cycles, then $\max(G) \leq 1$.
- 3. More generally, $\max(G) \leq 2^{\tau_p}$.

Let G be a strongly connected interaction graph.

- 4. If G has only positive cycles, then $\min(G) \ge 2$.
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Remarks

- No general lower bound on $\max(G)$.
- Few results on $\min(G)$.

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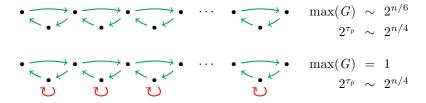
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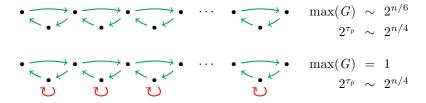
Theorem [Bridoux-Durbec-Perrot-R., 2019]

- 1. It is polynomial to decide if $max(G) \ge 1$.
- 2. It is **NP-complete** to decide if $max(G) \ge 2$.
- 3. It is **NEXPTIME-complete** to decide if min(G) = 0.

The bound 2^{τ_p} is very perfectible



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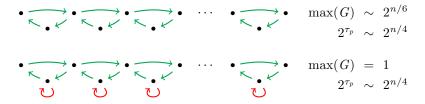
How introduce **negative cycles** in the bound?

 \hookrightarrow Difficult problem : positive cycles are sometime favorable

... and sometime unfavorable to the presence of many fixed points.

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$$(1) \longleftrightarrow (2) \\ (3) \qquad \max(K_3^+) = 2 \qquad (1) \longleftrightarrow (2) \\ (3) \qquad \max(K_3^-) = 3$$

Two approaches :

- 1. Fixe the graph and make variations on signs \rightarrow clique K_n .
- 2. Fixe the signs and make variations of the graphs \rightarrow all arcs positive.

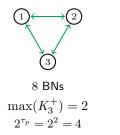
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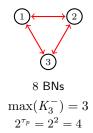
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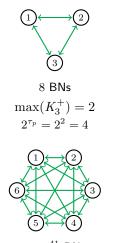
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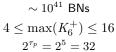
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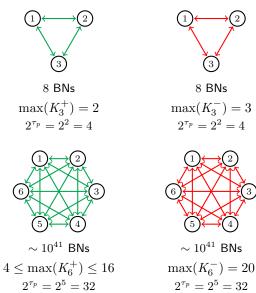


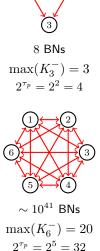
3

8 BNs

 $\max(K_3^-) = 3$

 $2^{\tau_p} = 2^2 = 4$





1. The **Hamming distance** between two states $x, y \in \{0, 1\}^n$ is

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Example

$$x = 00110011$$

 $y = 11110000$ $d_H(x, y) = 4.$

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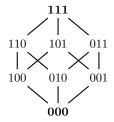
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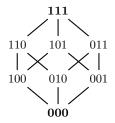
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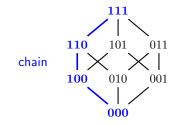
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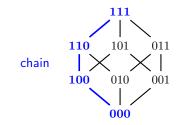
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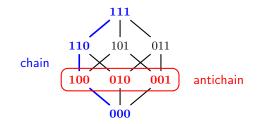
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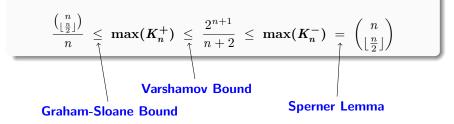
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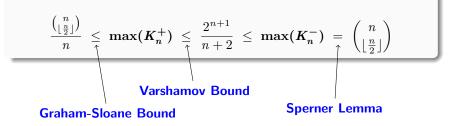
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Remark : In both cases, the positive feedback bound is 2^{n-1} , while

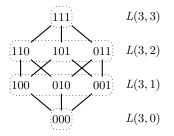
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Adrien Richard

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Lower bound for the positive clique

Let L(n,k) the set of $x \in \{0,1\}^n$ with exactly k ones; $|L(n,k)| = {n \choose k}$.



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Graham-Sloane Bound [1980]

It exists $A \subseteq L(n,k)$ with $d_H(x,y) \ge 4$ for all distinct $x, y \in A$ such that

$$|A| \ge \frac{\binom{n}{k}}{n}$$

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Upper bound for the positive clique

Let f be a BN on K_n^+ . If x and y are distinct fixed points of f, then

$$d_{\max}(x, y) := \max(|\{i : x_i < y_i\}|, |\{i : x_i > y_i\}|) \ge 2.$$

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Varshamov Bound [1965]

If $A \subseteq \{0,1\}^n$ and $d_{\max}(x,y) \ge 2$ for all distinct $x, y \in A$ distincts, then

$$A| \le \frac{2^{n+1}}{n+2}.$$

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Equality for the negative clique

Let f be a BN on K_n^- , we have $x \le y \Rightarrow f(x) \ge f(y)$.

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The maximum size of an antichain of $\{0,1\}^n$ is $\binom{n}{\lfloor \frac{n}{2} \rfloor}$.

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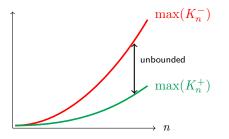
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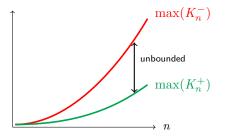
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Corollary. For all fixed k and sufficiently large n,

 $\max(K_n^-) > \max(K_{n+k}^+).$

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Conjecture

If K_n^{σ} is a signed clique with n vertices,

 $\max(K_n^\sigma) \leq \max(K_n^-)$

Two approaches :

- 1. Fixe the graph and make variations on signs \rightarrow clique K_n .
- 2. Fixe the signs and make variations of the graphs \rightarrow all arcs positive.

Outline

- 1. Absence of cycle
- 2. Positive and negative cycles
- 3. Absence of positive/negative cycle
- 4. Positive feedback bound
- 5. Positive and negative cliques
- 6. The monotone case
- 7. Conclusion

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2. What happens when there are only positive arcs?

Proposition

1. Suppose that G is strongly connected and has only positive cycles. Let G^+ be obtained from G by making positive every arc. Then

 $\max(G) = \max(G^+).$

2. Furthermore, every BN f on G^+ is monotone, that is,

 $\forall x, y \in \{0, 1\}^n \qquad x \le y \ \Rightarrow \ f(x) \le f(y).$

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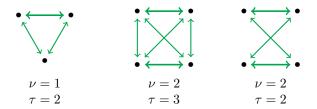
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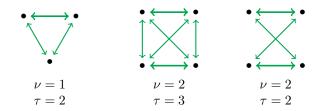
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Remark $\nu \leq \tau$

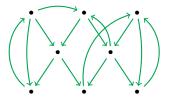
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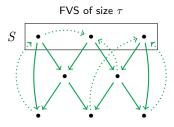
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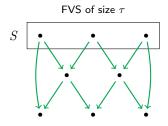
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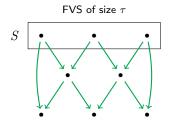
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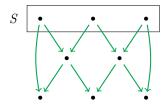


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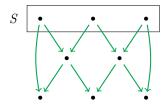


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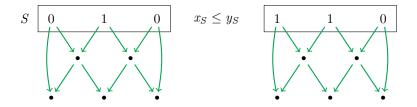
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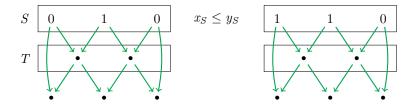
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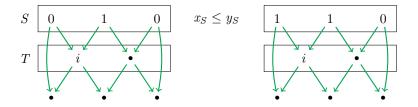
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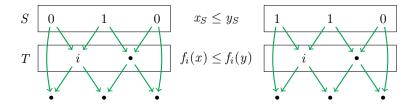
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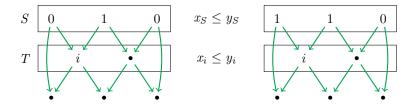
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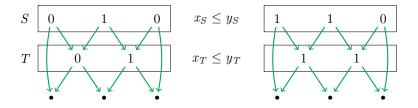
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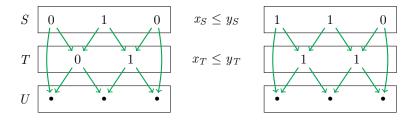
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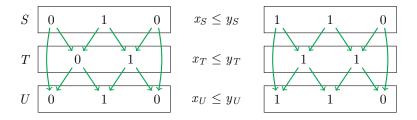
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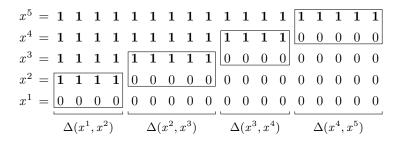
$x^5 = 1$	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
$x^4 = 1$	1	1	1	1	1	1	1	1	1	1	1	1	0	0	0	0	0
$x^3 = 1$	1	1	1	1	1	1	1	1	0	0	0	0	0	0	0	0	0
$x^2 = 1$	1	1	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0
$x^1 = 0$	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0

Theorem [Aracena-Salinas-R, 2017]

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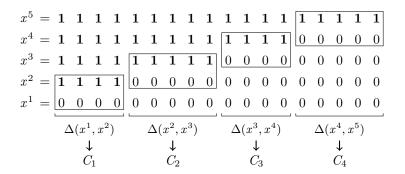
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Theorem [Aracena-Salinas-R, 2017]

If f is monotone, Fix(f) is isomorphic to a subset $L \subseteq \{0,1\}^{\tau}$ such that

- 1. L is a non-empty lattice
- 2. L has no chain of size $\nu + 2$

Proof of 2 If Fix(f) has a chain of k + 1 fixed points then $\nu \ge k$.

Thus Fix(f) has no chain of size $\nu + 2$, and L also.

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Remark The case $\ell = 1$ is Sperner Lemma on antichains

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Corollary If f is monotone then

 $|\mathsf{Fix}(f)| - 2 \leq \mathsf{sum} \mathsf{ of the } \nu - 1 \mathsf{ largest binomial coefficients } {\tau \choose k}$

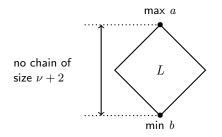
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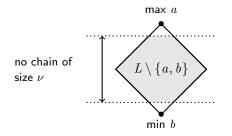
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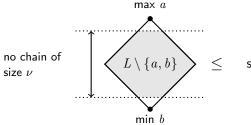
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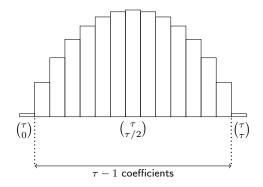
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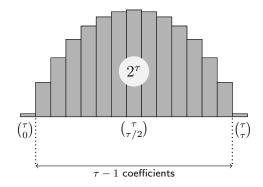
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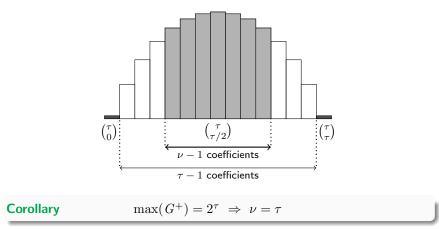


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The bound is interesting when ν is small compared with τ

The largest gap we known is $\nu \log \nu \leq 30\tau$ [Alon-Seymour 93]

Theorem [Reed-Robertson-Seymour-Thomas, 1995] It exists $h : \mathbb{N} \to \mathbb{N}$ such that, for every digraph G,

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Conjecture

 $\max(G) \le 2^{O(\nu \log \nu)}$

Outline

- 1. Absence of cycle
- 2. Positive and negative cycles
- 3. Absence of positive/negative cycle
- 4. Positive feedback bound
- 5. Positive and negative cliques
- 6. The monotone case

7. Conclusion

1. BNs are classical models for complexe systems : easy to define, but hard to predict.

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Graphe Theory

Even/odd cycles Erdős-Pósa property

Set Theory

Sperner Lemma Erdős extension Tarski Theorem

Coding Theory

Graham-Sloane bound Varshamov bound

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Conjecture : max(G) can be bounded according to the maximum number of vertex-disjoint positive cycles in G.

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Gracias!