# Complexity of maximum and minimum fixed point problems in Boolean networks

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joint work with

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Maximum/Minimum Fixed Point Problem

## **Boolean Network (BN)**

The local functions of  $f:\{0,1\}^3 \rightarrow \{0,1\}^3$  are defined by

$$\begin{cases} f_1(x) &= x_2 \lor x_3\\ f_2(x) &= \overline{x_1} \land \overline{x_3}\\ f_3(x) &= \overline{x_3} \land (x_1 \lor x_2) \end{cases}$$

#### Synchronous dynamics







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 $\hookrightarrow$  Talks of Guilhem Gamard, Julio Aracena, Kévin Perrot.

 $\hookrightarrow$  It is **NP-complete** to decide if a BN has a fixed point [Kosub 2008].

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 $\max(G) = 1$  $\min(G) = 0$ 

x	$\int f^1(x)$	$\int f^2(x)$	$f^3(x)$	$f^4(x)$	$f^5(x)$	$f^6(x)$	$f^7(x)$	$f^8(x)$
000	100	100	100	100	100	100	100	100
001	000	001	010	011	100	101	110	111
010	100	101	100	101	100	101	100	101
011	001	001	011	011	101	101	111	111
100	000	000	010	010	100	100	110	110
101	010	011	010	011	010	011	010	011
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Recall that it is NP-complete to decide if a BN has a fixed point.

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### Theorem [Aracena 2008]

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- 2. If G has only positive cycles and no source, then  $\min(G) \ge 2$ .

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It is **NP-complete** to decide if  $max(G) \ge 2$ .

It is **NP-complete** to decide if  $max(G) \ge k$  for every fixed  $k \ge 2$ .

# $\max(G) \ge k?$ is in NP

### Theorem [Perrot, R. 2021]

There is an algorithm with the following specifications:

Input: G and k pairs of states  $(x^1, y^1) \dots (x^k, y^k)$ . Output: Decide if there is a BN f on G with  $f(x^\ell) = y^\ell$  for  $1 \le \ell \le k$ . Running time:  $n^{O(k^2)}$ .

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- guess k states  $x^1, \ldots, x^k$ .
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- guess k states  $x^1, \ldots, x^k$ .
- give G and the pairs  $(x^1,x^1),\ldots,(x^k,x^k)$  to the previous algo.
- report the given result.
- $\hookrightarrow$  There is an excepting branch if and only if  $\max(G) \ge k$ .
- $\hookrightarrow$  The running time is  $n^{O(k^2)}$  thus polynomial since k is fixed.

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Basic observation:



The idea is to "control" with  $\phi$  the "effectiveness" of the negative chord, so that the chord can be "ineffective" if and only if  $\phi$  is satisfiable.















**Example** with  $\phi = (a \lor \overline{b} \lor c) \land (\overline{a} \lor \overline{c}).$ 



 $\phi$  is sat.  $\Rightarrow \max(G) \ge 2$ 

Consider a true assignment: a = 1, b = 1, c = 0

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$$\label{eq:general} \begin{split} \max(G) \geq 2 \Rightarrow \phi \text{ is sat.} \\ \text{Let } f \text{ be a BN on } G \text{ with} \end{split}$$

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$$\begin{array}{ccc} i & x_i < y_i \\ \hline i & x_i > y_i \\ \hline i & x_i = y_i \\ \hline i & x_i \le y_i \end{array}$$

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**Example** with  $\phi = (a \lor \overline{b} \lor c) \land (\overline{a} \lor \overline{c}).$ 



$$\label{eq:max} \begin{split} \max(G) \geq 2 \Rightarrow \phi \text{ is sat.} \\ \text{Let } f \text{ be a BN on } G \text{ with} \\ \text{two fixed points: } x \text{ and } y \end{split}$$

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are true assignments of  $\phi$ 

*k*-MAXPROBLEM: Given G, do we have  $max(G) \ge k$ ?

#### Theorem

*k*-MAXPROBLEM is in **P** if  $k \leq 1$  and **NP-complete** if  $k \geq 2$ .

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**Theorem** *k*-MINPROBLEM is **NEXPTIME-complete** for every *k*.

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#### It is **NEXPTIME-complete** to decide if min(G) = 0.

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The reduction is from SUCCINCTSAT and (much more) technical.

Adrien RICHARD

#### MAXPROBLEM: Given G and k, do we have $max(G) \ge k$ ?

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MAXPROBLEM and MINPROBLEM are **NEXPTIME-complete**.

# Reduction to SUCCINCTSAT

A succinct representation of  $\phi = (a \lor \overline{b} \lor \overline{c}) \land (\overline{a} \lor \overline{c})$ :



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#### Theorem

Given a succinct CNF formula  $\phi$  with m clauses we can built in polytime  $H_\phi$  such that

$$\max(H_{\phi}) \ge 2^{m+1} \iff \phi$$
 is satisfiable

## Reduction to $\operatorname{SuccinctSat}$

The interaction graph  $H_{\phi}$  for  $\phi = (a \lor \overline{b} \lor \overline{c}) \land (\overline{a} \lor \overline{c})$ .



# **Overview**

Problem	k = 1	$k \geq 2$ fixed	k part of the input	
$\max(G) \ge k$	Р	NP-complete	NEXPTIME-complete	
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When the maximum in-degree of G is bound by a constant  $d \ge 2$ :

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$\min(G) < k$	NP <sup>NP</sup> -complete		NP <sup>#P</sup> -complete

## **Positive Feedback Bound**

Let  $\tau^+(G)$  be the min nb of vertices delete to make G positive cycle-free. An important result concerning fixed points in BNs is:

Positive Feedback Bound [Aracena 2008]

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

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It is **NEXPTIME-complete** to decide if  $\max(G) = 2^{\tau^+(G)}$ .

# Conclusion

We study, from a complexity point of view, a natural class of problems.

### INTERACTION GRAPH CONSISTENCY PROBLEM

**Input:** An interaction graph G and a dynamical property P. **Question:** Is there a BN **on** G with a dynamics satisfying P?

We obtain exact classes of complexity for this problem when

- P is "to have at least/most k fixed points",
- k is fixed or free,
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# Perspectives

1. Other dynamical properties.

 $\hookrightarrow$  number/size of cyclic attractors in the (a)synchronous case.

2. Non-Boolean case and unsigned case.