

## Boolean network classes

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# Outline

The need for BN classes

Two classical families of BN classes

Outlook on BN classes

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## Boolean networks

A **Boolean network** (BN) is any

$$f : \{0, 1\}^n \rightarrow \{0, 1\}^n.$$

We see  $f = (f_1, \dots, f_n)$ , where each  $f_v : \{0, 1\}^n \rightarrow \{0, 1\}$  is a Boolean function.

Similarly, we see  $x = (x_1, \dots, x_n) \in \{0, 1\}^n$ .

## The need for BN classes

It's typical in maths to consider classes of objects with special properties.

Examples for graphs: trees, bipartite graphs, cographs, chordal graphs, perfect graphs, interval graphs, etc.

There are a lot of BNs! Here are the number of different objects on a set of  $n$  elements:

- ▶ (Simple) graphs:  $2^{\binom{n}{2}}$
- ▶ Digraphs, a.k.a. binary relations, a.k.a. Boolean matrices:  $2^{n^2}$
- ▶ Hypergraphs, a.k.a. set families, a.k.a. Boolean functions:  $2^{2^n}$
- ▶ **Boolean networks**:  $(2^{2^n})^n = 2^{n2^n}$ .

Therefore, we need to look at Boolean network classes.

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## BN classes: interaction graph

The **interaction graph** of  $f$ , denoted  $\mathbb{D}(f)$ , has vertex set  $[n]$  and  $uv$  is an arc in  $\mathbb{D}(f)$  if and only if  $f_v$  depends essentially on  $x_u$ , i.e.

$$\exists a, b \in \{0, 1\}^n \text{ such that } a_{-u} = b_{-u}, f_v(a) \neq f_v(b).$$

**Seminal result: Robert's theorem.** (Robert 80)

If  $\mathbb{D}(f)$  is acyclic, then  $f$  has a unique, globally attractive fixed point ( $f^n(x) = c$  for all  $x$ ).

## BN classes: interaction graph

### Extensions of Robert's theorem.

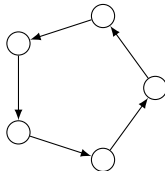
- ▶ Signed version: no positive cycles, no negative cycles (Aracena 04; Richard 10)
- ▶ Quantitative version: (Positive) feedback bound (Aracena 08; Riis 07) and many results after that
- ▶ Complexity results in the signed case (Bridoux, Dubec, Perrot, Richard 19)
- ▶ Dynamic characterisation of BNs with acyclic interaction graphs (G 20+)



## BN classes: interaction graph

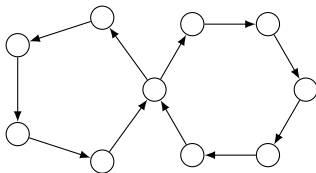
Other results for the following interaction graphs:

- ▶ Cycles (Remy, Mossé, Chaouiya, Thieffry 03;

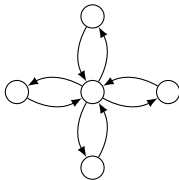


Demongeot, Sené, Noual 12)

- ▶ Double cycles (Noual 10)



- ▶ Flower graphs (Didier, Remy 12)



## BN classes: local functions

There is a natural partial order on  $\{0, 1\}^n$ :  $x \leq y$  if  $x_i \leq y_i$  for all  $1 \leq i \leq n$ .

$f$  is **monotone** if  $x \leq y \implies f(x) \leq f(y)$ . Equivalently,  $f$  is monotone if  $x \leq y \implies f_i(x) \leq f_i(y)$  for all  $1 \leq i \leq n$ .

**Seminal result: Knaster-Tarski theorem.** (Knaster 28; Tarski 55)

If  $f$  is monotone, then  $\text{Fix}(f)$  is a lattice (and hence, is not empty).

Related results:

- ▶ Bounds on the number of fixed points in (Aracena, Richard, Salinas 17)
- ▶ Fixed points asynchronously reachable by a geodesic (Richard 10; Melliti, Regnault, Richard, Sené 13)
- ▶ Monotone networks are fixable in cubic time (Aracena, G, Richard, Salinas, 20+)

## BN classes: local functions

Further results for other classes based on local functions:

- ▶ Monotone conjunctive networks (AND-networks)

$$f_i(x) = \bigwedge_{j \in N^+(i)} x_j$$

are fixable in linear time

- ▶ Number of fixed points of conjunctive networks

$$f_i(x) = \bigwedge_{j \in N^+(i)} x_j \wedge \bigwedge_{k \in N^-(i)} \bar{x}_k$$

(Aracena, Demongeot, Goles 04; Aracena, Richard, Salinas 14)

- ▶ Goles's theorem on symmetric threshold networks (Goles 80 and many extensions): period at most 2 on parallel, only fixed points in sequential
- ▶ Linear networks: see linear algebra
- ▶ Majority function, freezing networks: ask Eric

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## BN classes: metric properties

There is a natural metric on  $\{0, 1\}^n$ , namely the Hamming metric

Seminal result. (Polya 40)

The following are equivalent:

1.  $f$  is an **isometry** (i.e.  $d_H(f(x), f(y)) = d_H(x, y)$ )
2.  $f$  is an automorphism of the hypercube (i.e.  $f$  is bijective and  $d_H(x, y) = 1$  implies  $d_H(f(x), f(y)) = 1$ )
3.  $f$  is a union of cycles.

Extension to **non-expansive** networks, where  $d_H(f(x), f(y)) \leq d_H(x, y)$  (i.e. it is 1-Lipschitz) (Feder 92):

- ▶ Characterisation of sets of fixed points of non-expansive networks
- ▶ Dynamics are ultimately those of an isometry

## BN classes: asynchronous properties

Let  $b \subseteq [n]$ , then

$$f^{(b)}(x) = (f_b(x), x_{[n] \setminus b}).$$

For any word  $w = (w_1, \dots, w_t)$  with  $w_i \subseteq [n]$ , we denote

$$f^w = f^{(w_t)} \circ \dots \circ f^{(w_1)}.$$

A word  $B = (b_1, \dots, b_t)$  is **block-sequential** if  $b_i \cap b_j = \emptyset$  for  $i \neq j$  and  $\bigcup_{i=1}^t b_i = [n]$ .

**Proposition.** (Bridoux, G, Theyssier, “Commutative automata networks”)

The following are equivalent.

1.  $f$  is **commutative**, i.e.  $f^{(i,j)} = f^{(j,i)}$  for all  $i, j \in [n]$
2.  $f^{(b,c)} = f^{(c,b)}$  for all  $b, c \subseteq [n]$
3.  $f^B = f^C$  for any two block-sequential words  $B, C$  of  $[n]$
4.  $f = f^B$  for any block-sequential word  $B$  of  $[n]$ .

In other words, commutative networks are robust to changes in the update schedule.

## BN classes: asynchronous properties

**Theorem.** (Bridoux, G, Theyssier, “Commutative automata networks”)  
A Boolean network is commutative if and only if it is a **union of arrangement networks**.

## BN classes: asynchronous properties

We define arrangements as follows.

A **subcube** of  $\{0, 1\}^n$  is any set of the form  $X[s, \alpha] := \{x \in \{0, 1\}^n, x_s = \alpha\}$  for some  $s \subseteq Z$  and  $\alpha \in \{0, 1\}^s$ .

A family of subcubes  $X = \{X_\omega : \omega \in \Omega\}$  is called an **arrangement** if  $X_\omega \cap X_\xi \neq \emptyset$  for all  $\omega, \xi \in \Omega$  and  $X_\omega \not\subseteq X_\xi$  for all  $\omega \neq \xi$ .

We denote the **content** of  $X$  by  $\hat{X} := \bigcup_{\omega \in \Omega} X_\omega$ .

If  $X = \{X_\omega = X[s^\omega, \alpha^\omega] : \omega \in \Omega\}$  is an arrangement, then the dimensions of  $\hat{X}$  are as follows.

- ▶ Let  $\tau := \bigcap_{\omega \in \Omega} s^\omega$ , then  $\tau$  is the set of **external dimensions** of  $\hat{X}$ .
- ▶ Let  $\sigma := \bigcup_{\omega \in \Omega} s^\omega$ , then  $[n] \setminus \sigma$  is the set of **free dimensions** of  $\hat{X}$ . Then  $\bigcap_{\omega \in \Omega} X_\omega = X[\sigma, \alpha]$ .
- ▶ The other dimensions in  $\sigma \setminus \tau$  are the **tight dimensions** of  $\hat{X}$ .



## BN classes: asynchronous properties

**Arrangement network:** Let  $X$  be an arrangement. Then on  $\hat{X}$ , let

1.  $f_i(x) = \alpha_i$  for every tight dimension  $i$  of  $\hat{X}$ ,
2.  $f_j$  be uniform nontrivial for any free dimension  $j$ ,
3. and  $f_k$  be trivial on any external dimension of  $\hat{X}$ .

Outside of  $\hat{X}$ ,  $f$  is trivial:  $f(x) = x$  if  $x \notin \hat{X}$ .

Any arrangement network is commutative.

## BN classes: asynchronous properties

We can combine families of commutative networks as follows.

$x$  is an **unreachable fixed point** of  $f$  if

$$f^{(s)}(y) = x \iff y = x \quad \forall s \subseteq [n], s \neq \emptyset.$$

Let  $R(f)$  be the set of non-(unreachable fixed points) of  $f$ . If  $\{f^a : a \in A\}$  is a family of networks with  $R(f^a) \cap R(f^{a'}) = \emptyset$  for all  $a, a' \in A$ , we define their **union** as

$$F(x) := \bigcup_{a \in A} f^a(x) = \begin{cases} f^a(x) & \text{if } x \in R(f^a) \\ x & \text{otherwise.} \end{cases}$$

Any union of arrangement networks is commutative.

## BN classes: looking further

Some other ways of defining BN classes:

- ▶ Recursively
- ▶ Substructure definition of BN: subnetwork, reduction, Boolean derivative...
- ▶ Finite field form:  $f$  is a polynomial over  $\text{GF}(2^n)$  ( $f(x) = \alpha x$  used in (Bridoux, G, Theyssier 20+))
- ▶ Using clones for families of local functions (see Post's lattice)

Merci !

¡Muchas gracias!

Thank you!