

# Twin-width

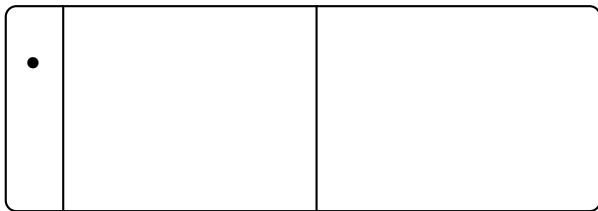
Édouard Bonnet

based on joint works with Colin Geniet, Ugo Giocanti, Eunjung Kim, Jarik Nešetřil, Patrice Ossona de Mendez, Amadeus Reinald, Sebastian Siebertz, Pierre Simon, Stéphan Thomassé, Szymon Toruńczyk, and Rémi Watrigant

ENS Lyon, LIP

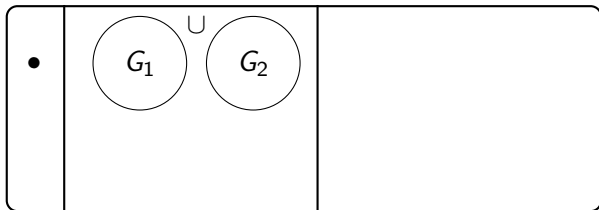
June 25th, 2021, WG

# Cographs



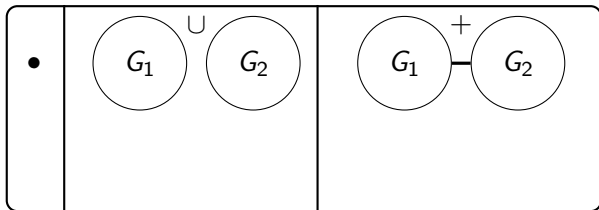
A single vertex is a cograph,

# Cographs



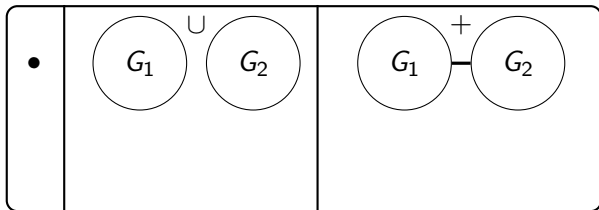
as well as the union of two cographs,

# Cographs

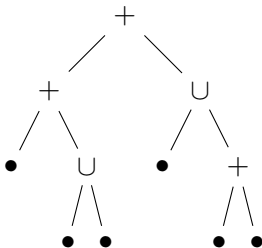


and the complete join of two cographs.

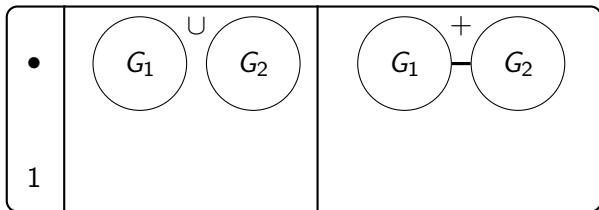
# Cographs



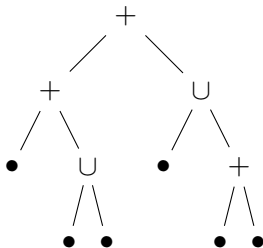
Many NP-hard problems are polytime solvable on cographs



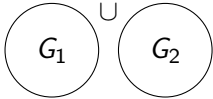
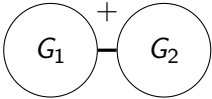
# Cographs



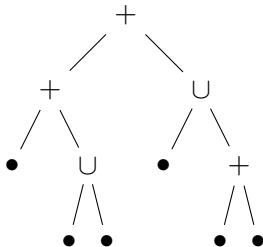
Let's try to compute the NP-hard  $\alpha(G)$ , independence number



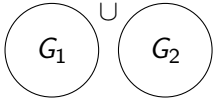
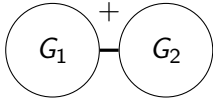
# Cographs

•	 $G_1 \cup G_2$	 $G_1 + G_2$
1	$\alpha(G_1) + \alpha(G_2)$	

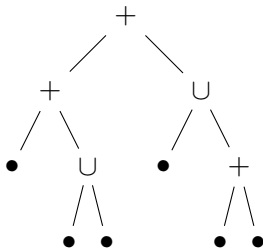
In case of a disjoint union: combine the solutions



# Cographs

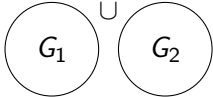
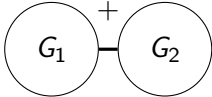
•		
1	$\alpha(G_1) + \alpha(G_2)$	$\max\{\alpha(G_1), \alpha(G_2)\}$

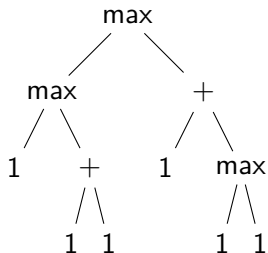
In case of a complete join: pick the larger one





# Cographs

•		
1	$\alpha(G_1) + \alpha(G_2)$	$\max\{\alpha(G_1), \alpha(G_2)\}$



## Equivalent cograph definition

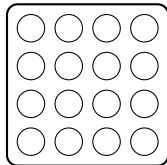
Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



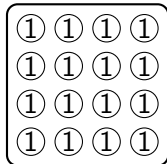
**Is there another algorithmic scheme based on this definition?**

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



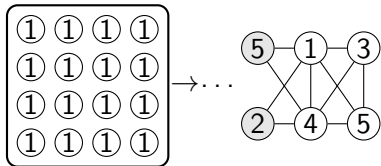
Let's try with  $\alpha(G)$ , and store in a vertex its inner max solution

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



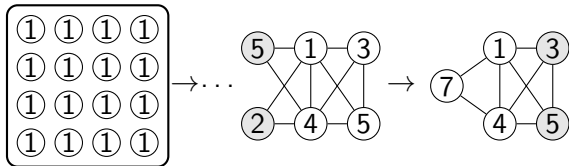
We can find a pair of false/true twins

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



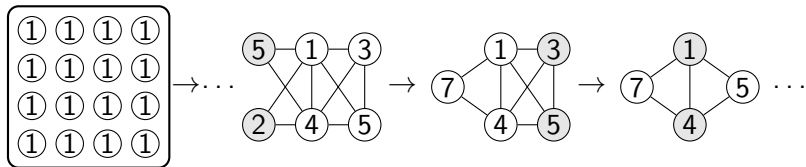
Sum them if they are false twins

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



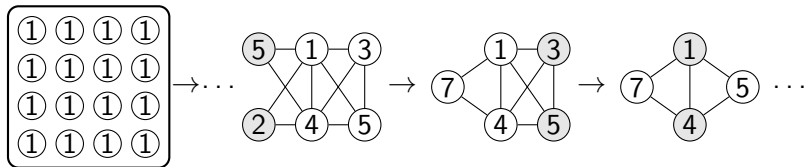
Max them if they are true twins

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



The eventual single vertex contains  $\alpha(G)$

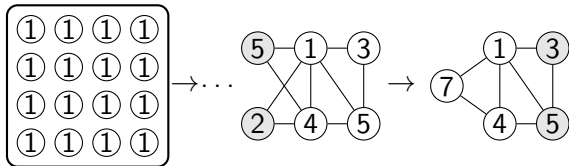
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<sup>1</sup>provided it has at least two vertices



## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



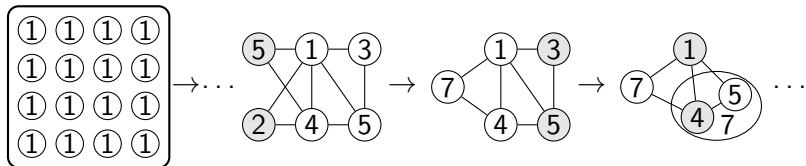
**What if we only have near twins?**

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



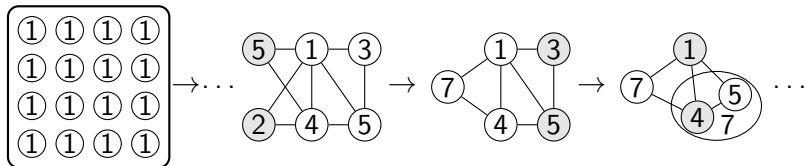
A few partial solutions to memorize

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<sup>1</sup>provided it has at least two vertices

## Equivalent cograph definition

Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



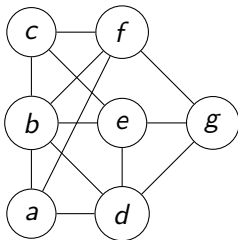
A few partial solutions to memorize

*Errors occur in bounded size components* → bounded rank-width  
*Errors occur with bounded degree* → bounded twin-width

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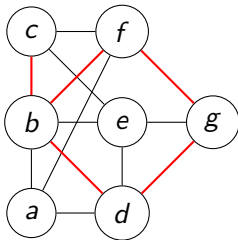
<sup>1</sup>provided it has at least two vertices

## Graphs



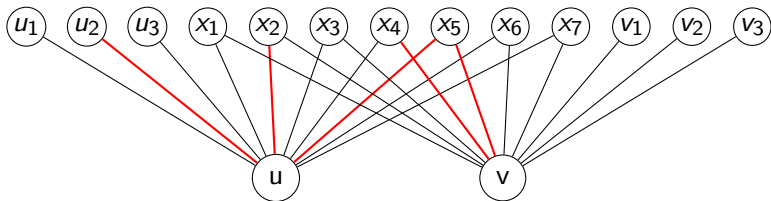
Two outcomes between a pair of vertices:  
edge or non-edge

## Trigraphs



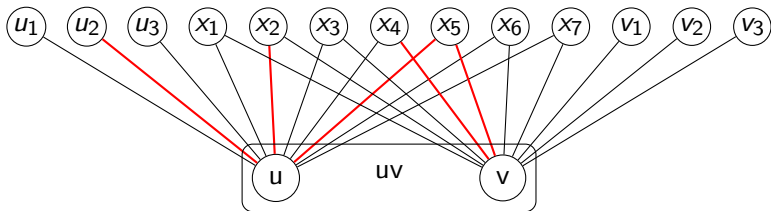
Three outcomes between a pair of vertices:  
edge, or non-edge, or red edge (error edge)

## Contractions in trigraphs



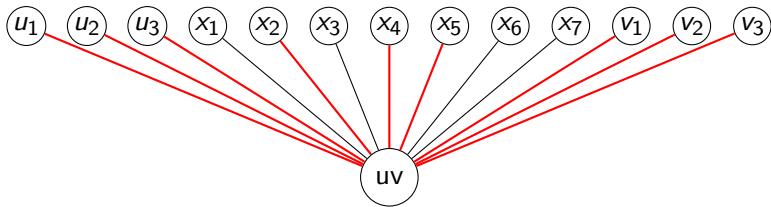
Identification of two non-necessarily adjacent vertices

## Contractions in trigraphs



Identification of two non-necessarily adjacent vertices

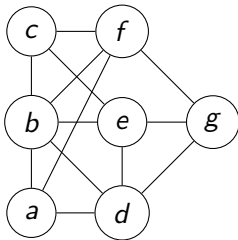
## Contractions in trigraphs



edges to  $N(u) \Delta N(v)$  turn red, for  $N(u) \cap N(v)$  red is absorbing



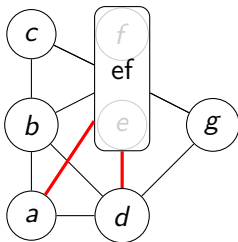
## Contraction sequence



A contraction sequence of  $G$ :

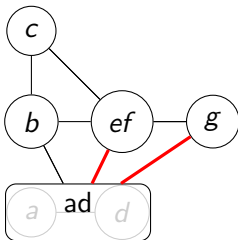
Sequence of trigraphs  $G = G_n, G_{n-1}, \dots, G_2, G_1$  such that  $G_i$  is obtained by performing one contraction in  $G_{i+1}$ .

## Contraction sequence



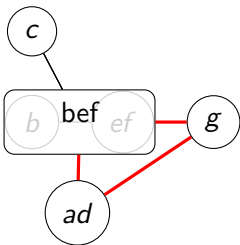
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## Contraction sequence



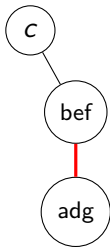
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## Contraction sequence



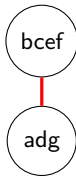
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## Contraction sequence

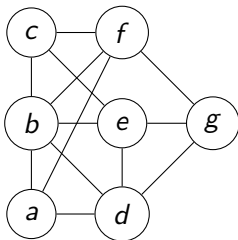


A contraction sequence of  $G$ :

Sequence of trigraphs  $G = G_n, G_{n-1}, \dots, G_2, G_1$  such that  $G_i$  is obtained by performing one contraction in  $G_{i+1}$ .

## Twin-width

$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .

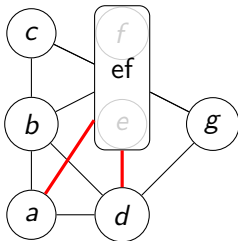


Maximum red degree = 0  
**overall maximum red degree = 0**



# Twin-width

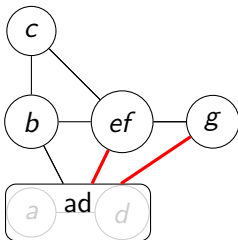
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 2  
**overall maximum red degree = 2**

# Twin-width

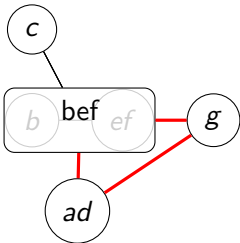
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 2  
**overall maximum red degree = 2**

## Twin-width

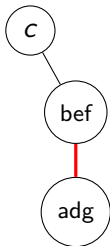
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 2  
**overall maximum red degree = 2**

## Twin-width

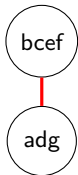
$\text{tww}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 1  
**overall maximum red degree = 2**

# Twin-width

$\text{tww}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 1  
**overall maximum red degree = 2**

# Twin-width

$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .

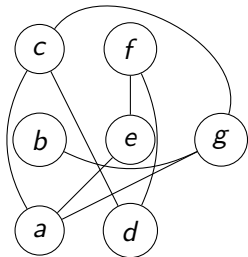


Maximum red degree = 0  
**overall maximum red degree = 2**

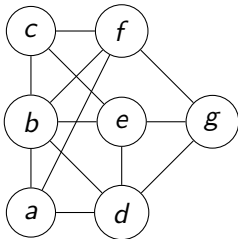
## Simple operations preserving small twin-width

- ▶ **complementation: remains the same**
- ▶ taking induced subgraphs: may only decrease
- ▶ adding one vertex linked arbitrarily: at most “doubles”
- ▶ **modular decomposition: max of the twin-widths**

## Complementation



$\overline{G}$

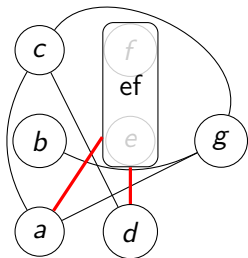


$G$

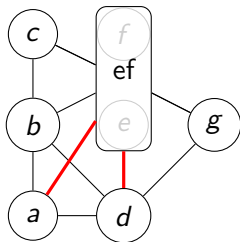
$$\text{tww}(\overline{G}) = \text{tww}(G)$$



# Complementation



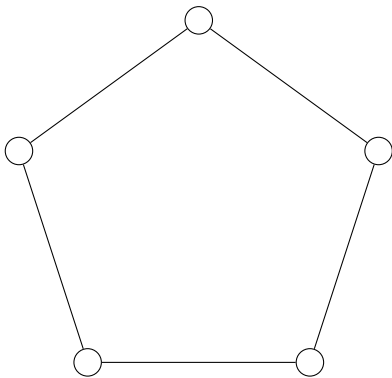
$\overline{G_6}$



$G_6$

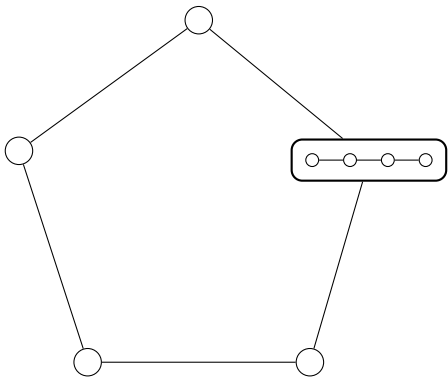
$$\text{tww}(\overline{G}) = \text{tww}(G)$$

## Substitution and lexicographic product



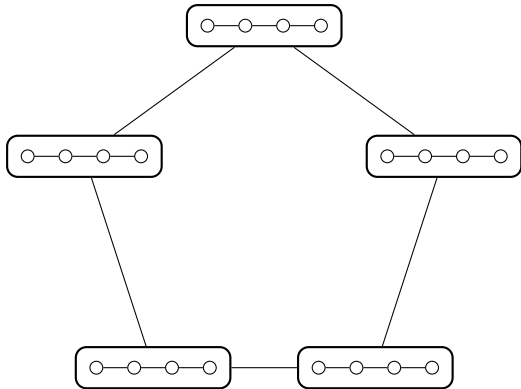
$$G = C_5$$

## Substitution and lexicographic product



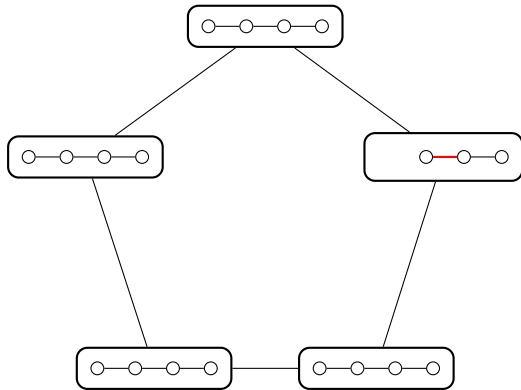
$G = C_5$ ,  $H = P_4$ , substitution  $G[v \leftarrow H]$

## Substitution and lexicographic product



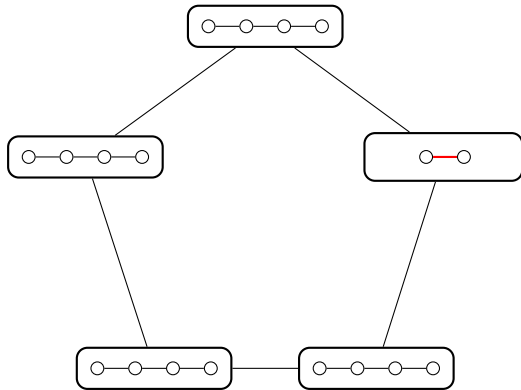
$G = C_5$ ,  $H = P_4$ , lexicographic product  $G[H]$

## Substitution and lexicographic product



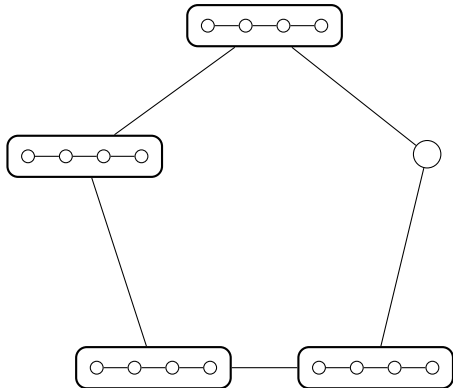
More generally any modular decomposition

## Substitution and lexicographic product



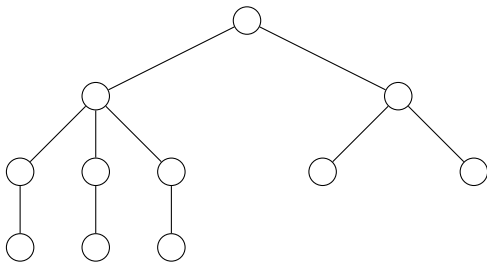
More generally any modular decomposition

## Substitution and lexicographic product



$$\text{tww}(G[H]) = \max(\text{tww}(G), \text{tww}(H))$$

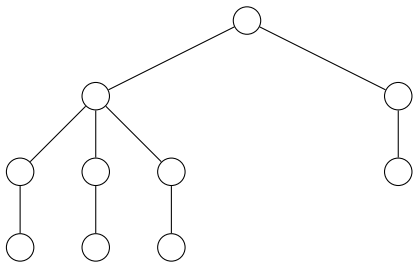
## Graphs with bounded twin-width – trees



If possible, contract two twin leaves

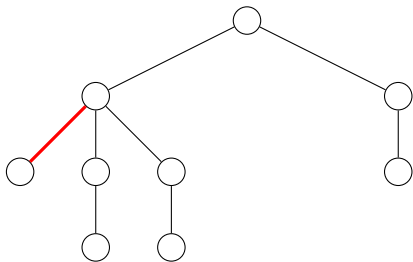


## Graphs with bounded twin-width – trees



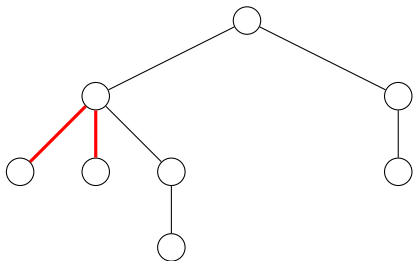
If not, contract a deepest leaf with its parent

## Graphs with bounded twin-width – trees



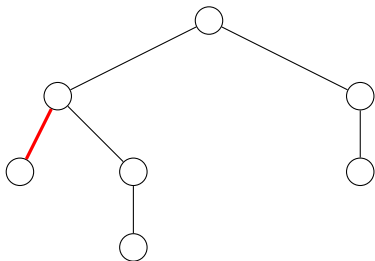
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## Graphs with bounded twin-width – trees



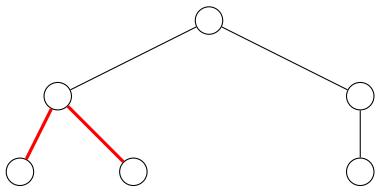
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## Graphs with bounded twin-width – trees



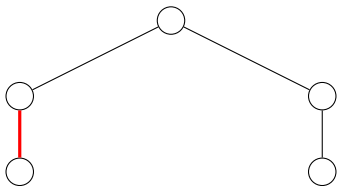
Cannot create a red degree-3 vertex

## Graphs with bounded twin-width – trees



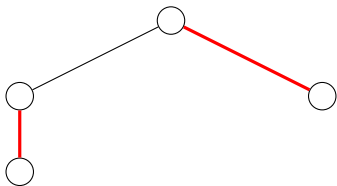
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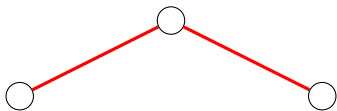
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## Graphs with bounded twin-width – trees



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## Graphs with bounded twin-width – trees



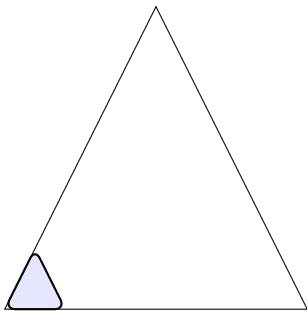
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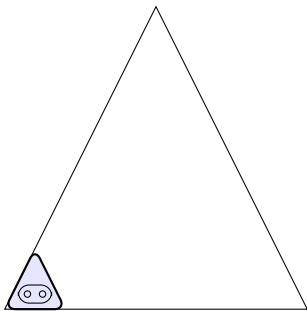
Cannot create a red degree-3 vertex

## Graphs with bounded twin-width – trees



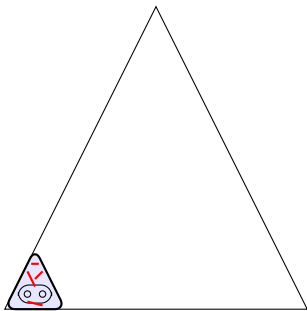
Generalization to bounded *rank-width*

## Graphs with bounded twin-width – trees



Two near-twins in a small subtree  $\rightarrow$  contraction

## Graphs with bounded twin-width – trees

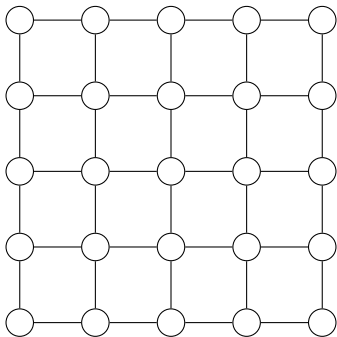


Red edges cluster in bounded size components

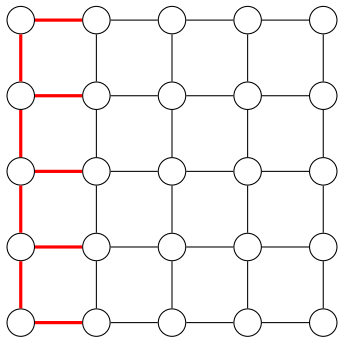
Theorem (B., Kim, Reinald, Thomassé, Watrigant, '21+)

*A class has bounded rank-width if and only if its graphs admit contraction sequences for which the red components are bounded.*

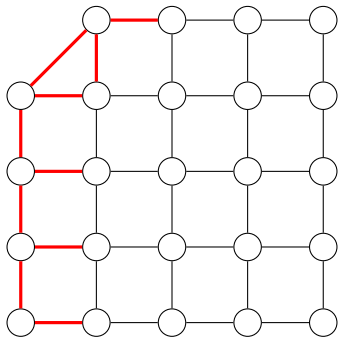
## Graphs with bounded twin-width – grids



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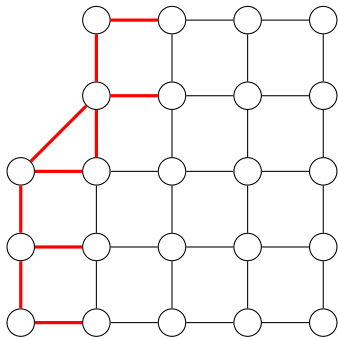


## Graphs with bounded twin-width – grids

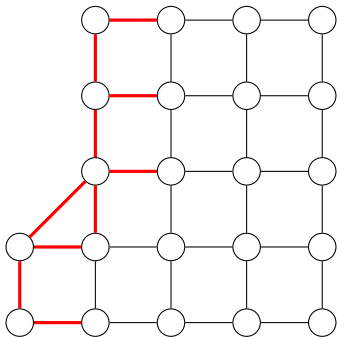




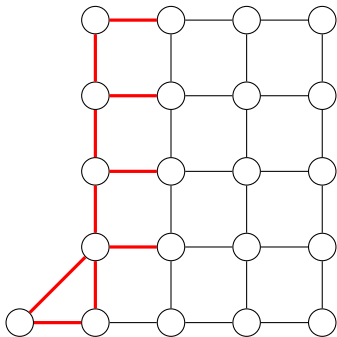
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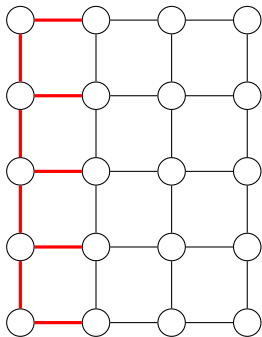
## Graphs with bounded twin-width – grids



## Graphs with bounded twin-width – grids



## Graphs with bounded twin-width – grids



4-sequence for planar grids,  $3d$ -sequence for  $d$ -dimensional grids

# Universal bipartite graph

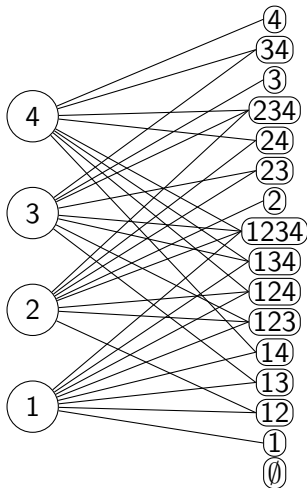
No  $O(1)$ -contraction sequence:

**twin-width is *not* an iterated identification of near twins.**

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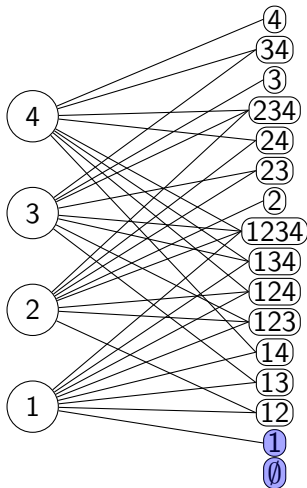
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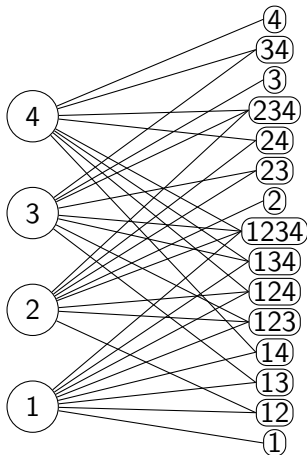
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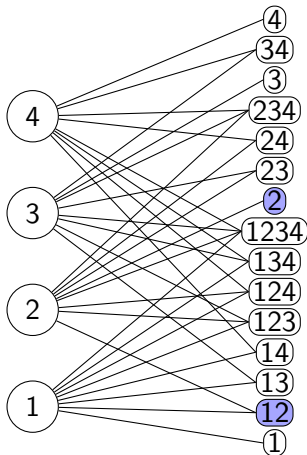




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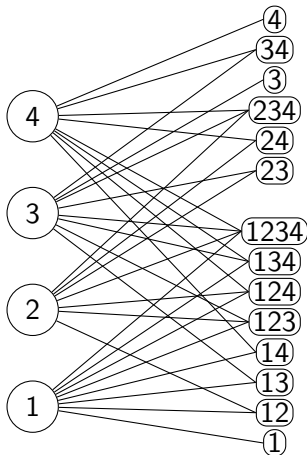
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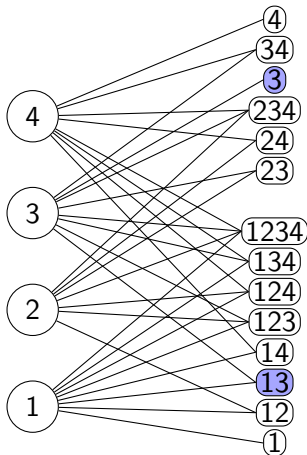
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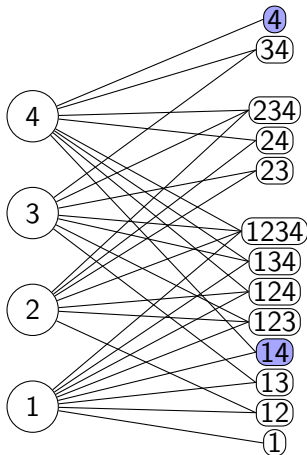
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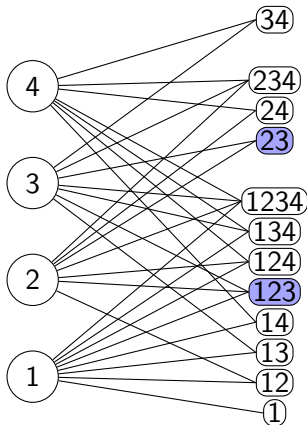
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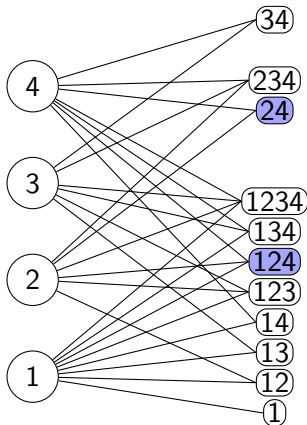
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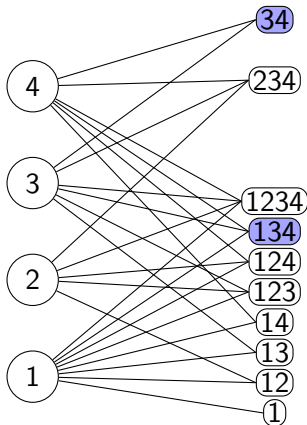
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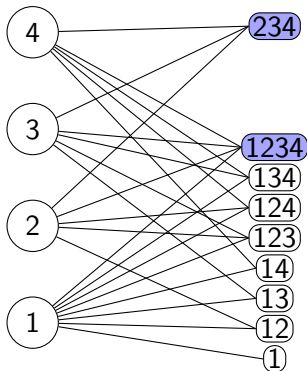
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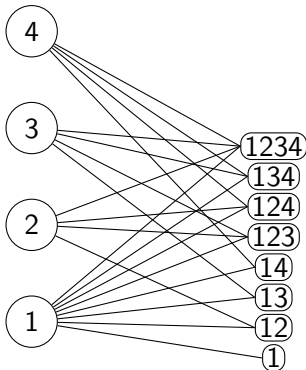




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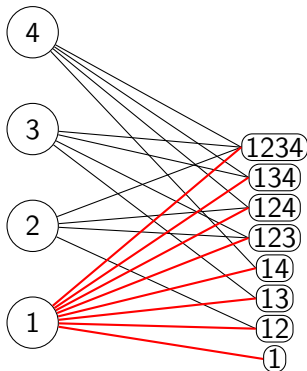
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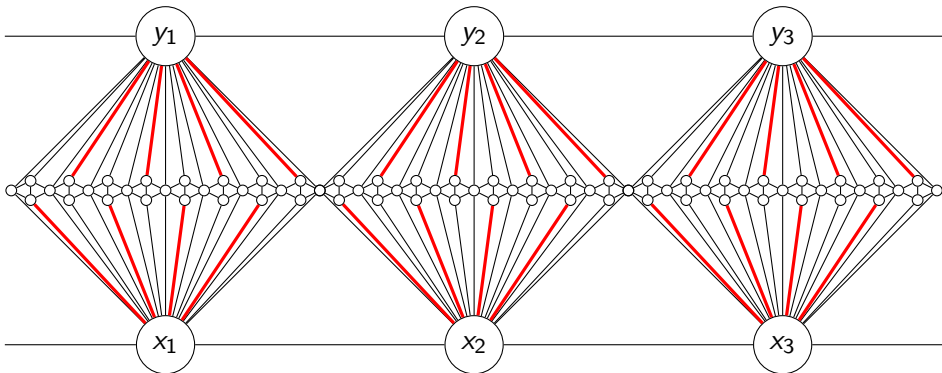
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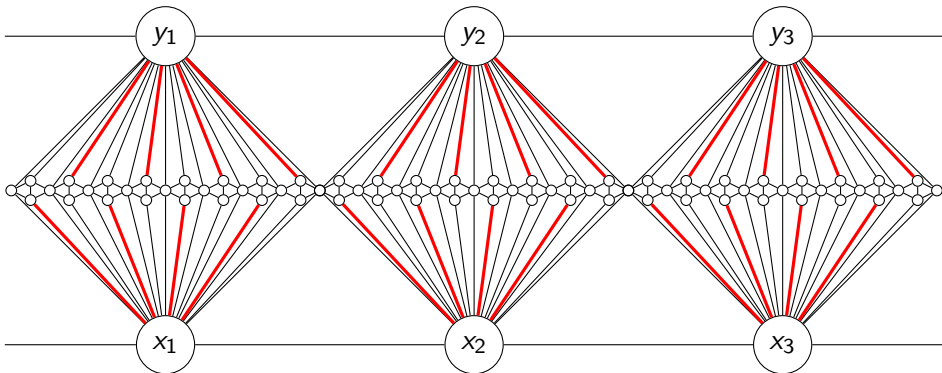
Graphs with bounded twin-width – planar graphs?

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For every  $d$ , a planar trigraph without planar  $d$ -contraction

# Graphs with bounded twin-width – planar graphs?



For every  $d$ , a planar trigraph without planar  $d$ -contraction

**More powerfool tool needed**

## Twin-width in the language of matrices

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ 1 & 0 & 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \end{bmatrix}$$

Encode a bipartite graph (or, if symmetric, any graph)

## Twin-width in the language of matrices

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ 1 & 0 & 0 & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \end{bmatrix}$$

Contraction of two columns (similar with two rows)

## Twin-width in the language of matrices

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 1 & r & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \\ 0 & 1 & r & 0 & 1 & 0 & 1 & 0 \\ 1 & 0 & r & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \end{bmatrix}$$

How is the twin-width (re)defined?



## Twin-width in the language of matrices

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 1 & 1 & 1 & 0 \\ 0 & 1 & r & 0 & 0 & 1 & 0 & 1 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \\ 0 & 1 & r & 0 & 1 & 0 & 1 & 0 \\ 1 & 0 & r & 1 & 1 & 0 & 1 & 0 \\ 0 & 1 & 1 & 1 & 1 & 1 & 0 & 0 \\ 1 & 0 & 1 & 1 & 1 & 0 & 0 & 1 \end{bmatrix}$$

How to tune it for non-bipartite graph?

## Partition viewpoint

Matrix partition: partitions of the row set and of the column set

Matrix division: same but all the parts are *consecutive*

1	1	1	1	1	1	1	0
0	1	1	0	0	1	0	1
0	0	0	0	0	0	0	1
0	1	0	0	1	0	1	0
1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

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1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

Maximum number of non-constant zones per column or row part  
= **error value**

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0	1	1	0	0	1	0	1
0	0	0	0	0	0	0	1
0	1	0	0	1	0	1	0
1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

Maximum number of non-constant zones per column or row part  
... until there are a single row part and column part

## Partition viewpoint

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0	1	1	0	0	1	0	1
0	0	0	0	0	0	0	1
0	1	0	0	1	0	1	0
1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

**Twin-width as maximum error value  
of a contraction sequence**

## Grid minor

$t$ -grid minor:  $t \times t$ -division where every cell is non-empty

Non-empty cell: contains at least one 1 entry

1	1	1	1	1	0
0	1	1	0	0	1
0	0	0	0	0	1
0	1	0	0	1	0
1	0	0	1	1	0
0	1	1	1	1	0
1	0	1	1	1	0

4-grid minor

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0	0	0	0	0	1
0	1	0	0	1	0
1	0	0	1	1	0
0	1	1	1	1	0
1	0	1	1	1	0

4-grid minor

A matrix is said  **$t$ -grid free** if it does not have a  $t$ -grid minor

## Mixed minor

Mixed cell: not horizontal nor vertical

1	1	1	1	1	1	0
0	1	1	0	0	1	0
0	0	0	0	0	0	1
0	1	0	0	1	0	1
1	0	0	1	1	0	1
0	1	1	1	1	1	0
1	0	1	1	1	0	1

3-mixed minor



## Mixed minor

Mixed cell: not horizontal nor vertical

1	1	1	1	1	0
0	1	1	0	0	1
0	0	0	0	0	1
0	1	0	0	1	0
1	0	0	1	1	0
0	1	1	1	1	0
1	0	1	1	1	1

3-mixed minor

Every mixed cell is witnessed by a  $2 \times 2$  square = **corner**

## Mixed minor

Mixed cell: not horizontal nor vertical

1	1	1	1	1	1	0
0	1	1	0	0	1	1
0	0	0	0	0	0	1
0	1	0	0	1	0	1
1	0	0	1	1	0	1
0	1	1	1	1	1	0
1	0	1	1	1	0	1

3-mixed minor

A matrix is said ***t*-mixed free** if it does not have a *t*-mixed minor

## Twin-width and mixed freeness

Theorem (B., Kim, Thomassé, Watrigant '20)

*If  $G$  admits a  $t$ -mixed free adjacency matrix, then  $\text{tw}(G) = 2^{2^{O(t)}}$ .*

## Twin-width and mixed freeness

Theorem (B., Kim, Thomassé, Watrigant '20)

If  $\exists \sigma$  s.t.  $\text{Adj}_\sigma(G)$  is  $t$ -mixed free, then  $\text{tw}(G) = 2^{2^{O(t)}}$ .

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**Step 1: find a division sequence  $(\mathcal{D}_i)_i$  with mixed value  $f(t)$**

1	1	1	1	1	1	1	0
0	1	1	0	0	1	0	1
0	0	0	0	0	0	0	1
0	1	0	0	1	0	1	0
1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
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Merge consecutive parts greedily

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1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

Stuck, removing every other separation  $\rightarrow \frac{f(t)}{2}$  mixed cells per part



## Stanley-Wilf conjecture/Marcus-Tardos theorem

### Theorem (Marcus, Tardos '04)

*For every  $k$ , there is a  $c_k$  such that every  $n \times m$  0,1-matrix with at least  $c_k \max(n, m)$  1 entries admits a  $k$ -grid minor.*

## Twin-width and mixed freeness

Theorem (B., Kim, Thomassé, Watrigant '20)

If  $\exists \sigma$  s.t.  $\text{Adj}_\sigma(G)$  is  $t$ -mixed free, then  $\text{tw}(G) = 2^{2^{O(t)}}$ .

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1	1	1	1	1	1	1	0
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1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

Stuck, removing every other separation  $\rightarrow \frac{f(t)}{2}$  mixed cells per part

**Impossible!**

## Twin-width and mixed freeness

Theorem (B., Kim, Thomassé, Watrigant '20)

If  $\exists \sigma$  s.t.  $\text{Adj}_\sigma(G)$  is  $t$ -mixed free, then  $\text{tw}_w(G) = 2^{2^{O(t)}}$ .

**Step 1: find a division sequence  $(\mathcal{D}_i)_i$  with mixed value  $f(t)$**

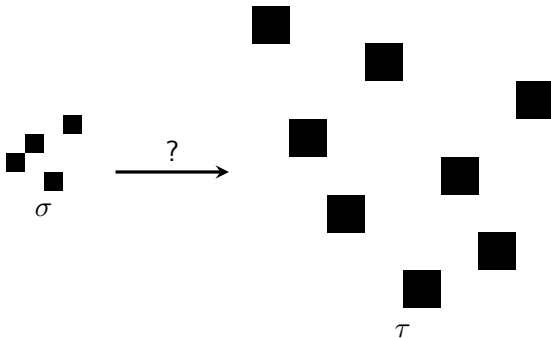
**Step 2: find a contraction sequence with error value  $g(t)$**

1	1	1	1	1	1	1	0
0	1	1	0	0	1	0	1
0	0	0	0	0	0	0	1
0	1	0	0	1	0	1	0
1	0	0	1	1	0	1	0
0	1	1	1	1	1	0	0
1	0	1	1	1	0	0	1

Refinement of  $\mathcal{D}_i$  where each part coincides on the non-mixed cells

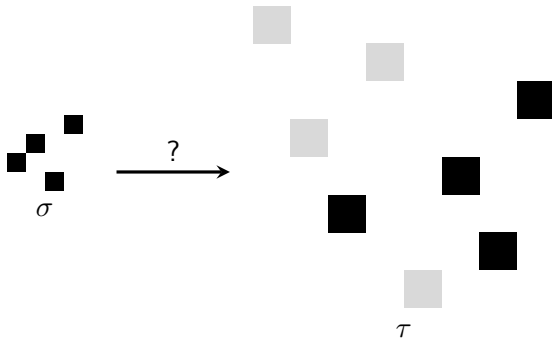
# Follows Guillemot & Marx algorithm '14

Linear FPT algorithm for PERMUTATION PATTERN



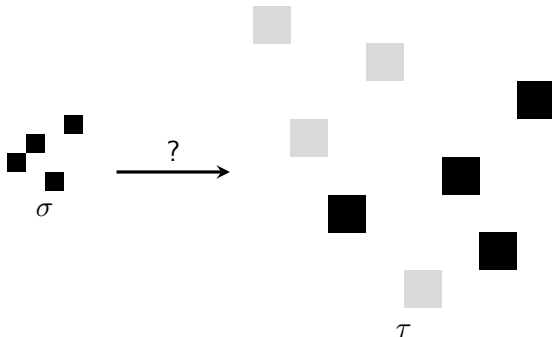
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# Follows Guillemot & Marx algorithm '14

Linear FPT algorithm for PERMUTATION PATTERN



*"It would be interesting to see if there is a corresponding graph-theoretic analog for this scheme, which might be useful for solving some graph-theoretical problem."*

## Twin-width and mixed freeness

Theorem (B., Kim, Thomassé, Watrigant '20)

If  $\exists \sigma$  s.t.  $\text{Adj}_\sigma(G)$  is  $t$ -mixed free, then  $\text{tw}(G) = 2^{2^{O(t)}}$ .

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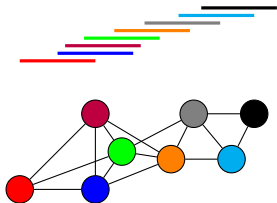
Now to bound the twin-width of a class  $\mathcal{C}$ :

- 1) Find a *good* vertex-ordering procedure
- 2) Argue that, in this order, a  $t$ -mixed minor would conflict with  $\mathcal{C}$

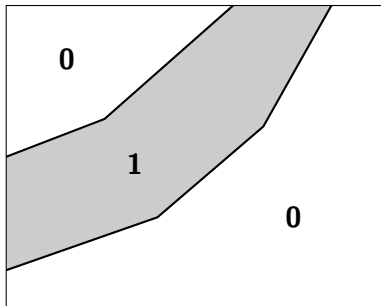


# Unit interval graphs

Intersection graph of unit segments on the real line

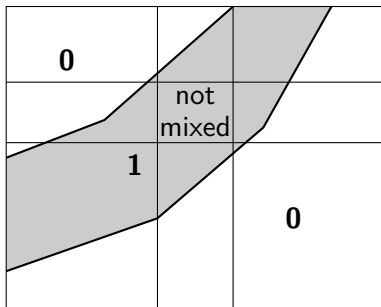


## Bounded twin-width – unit interval graphs



order by left endpoints

## Bounded twin-width – unit interval graphs



No 3-by-3 grid has all 9 cells crossed by two non-decreasing curves

## Graph minors

Formed by **vertex deletion**, **edge deletion**, and **edge contraction**

A graph  $G$  is *H-minor free* if  $H$  is not a minor of  $G$

A graph class is *H-minor free* if all its graphs are

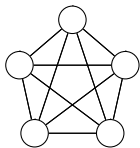
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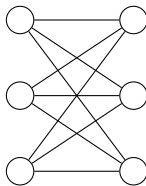
A graph  $G$  is  $H$ -minor free if  $H$  is not a minor of  $G$

A graph class is  $H$ -minor free if all its graphs are

Planar graphs are exactly the graphs without  $K_5$  or  $K_{3,3}$  as a minor

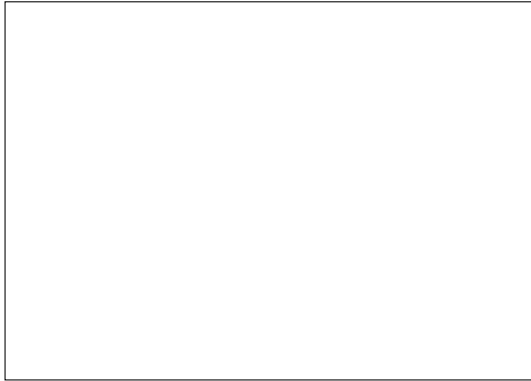


$K_5$



$K_{3,3}$

Bounded twin-width –  $K_t$ -minor free graphs



Given a hamiltonian path, we would just use this order

# Bounded twin-width – $K_t$ -minor free graphs

$B_t$	1	1	1	1		1
$B_4$	1	1	1	1		1
$B_3$	1	1	1	1		1
$B_2$	1	1	1	1		1
$B_1$	1	1	1	1		1
	$A_1$	$A_2$	$A_3$	$A_4$		$A_t$

Contracting the  $2t$  subpaths yields a  $K_{t,t}$ -minor, hence a  $K_t$ -minor

## Bounded twin-width – $K_t$ -minor free graphs

$B_t$	1	1	1	1		1
$B_4$	1	1	1	1		1
$B_3$	1	1	1	1		1
$B_2$	1	1	1	1		1
$B_1$	1	1	1	1		1
	$A_1$	$A_2$	$A_3$	$A_4$		$A_t$

Instead we use a specially crafted lex-DFS discovery order



## Theorem

*The following classes have bounded twin-width, and  $O(1)$ -sequences can be computed in polynomial time.*

- ▶ *Bounded rank-width, and even, boolean-width graphs,*
- ▶ *every hereditary proper subclass of permutation graphs,*
- ▶ *posets of bounded antichain size (seen as digraphs),*
- ▶ *unit interval graphs,*
- ▶  *$K_t$ -minor free graphs,*
- ▶ *map graphs,*
- ▶ *subgraphs of  $d$ -dimensional grids,*
- ▶  *$K_t$ -free unit  $d$ -dimensional ball graphs,*
- ▶  *$\Omega(\log n)$ -subdivisions of all the  $n$ -vertex graphs,*
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- ▶ *strong products of two bounded twin-width classes, one with bounded degree, etc.*

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**Can we solve problems faster, given an  $O(1)$ -sequence?**

## Example of $k$ -INDEPENDENT SET

$d$ -sequence:  $G = G_n, G_{n-1}, \dots, G_2, G_1 = K_1$

Algorithm: **Compute by dynamic programming a best partial solution in each red connected subgraph of size at most  $k$ .**

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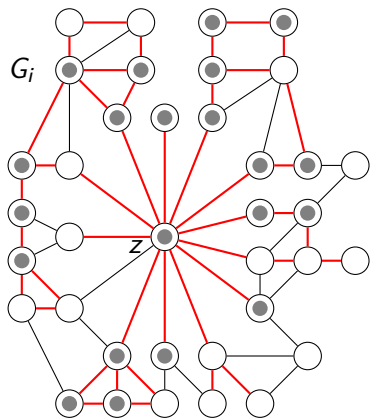
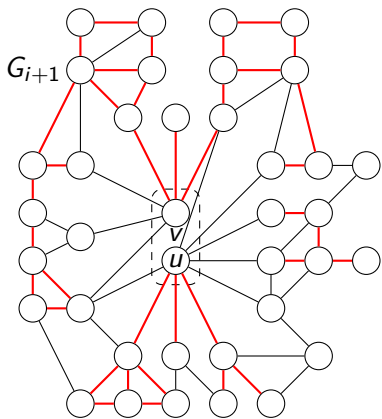
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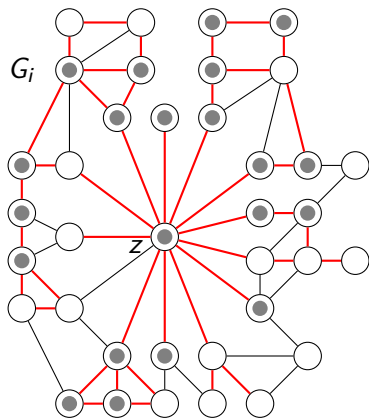
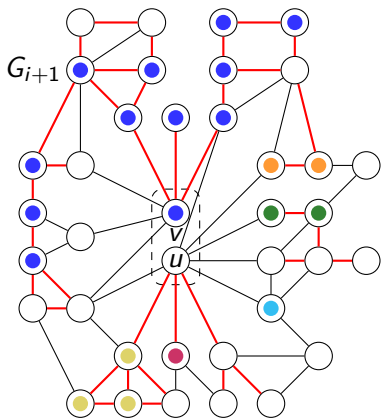
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**How to go from the partial solutions of  $G_{i+1}$  to those of  $G_i$ ?**



Best partial solution inhabiting ●?



3 unions of  $\leq d + 2$  red connected subgraphs to consider in  $G_{i+1}$   
with  $u$ , or  $v$ , or both



# Other (almost) single-exponential parameterized algorithms

## Theorem

Given a  $d$ -sequence  $G = G_n, \dots, G_1 = K_1$ ,

- ▶  $k$ -INDEPENDENT SET,
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- ▶  $(r, k)$ -SCATTERED SET,
- ▶  $k$ -DOMINATING SET, *and*
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can be solved in time  $2^{O(k)} n$ ,

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A more general FPT algorithm?

## First-order model checking on graphs

GRAPH FO MODEL CHECKING

**Parameter:**  $|\varphi|$

**Input:** A graph  $G$  and a first-order sentence  $\varphi \in FO(\{E_2, =_2\})$

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$G \models \varphi? \Leftrightarrow k$ -INDEPENDENT SET

## FO interpretations and transductions

**FO simple interpretation:** redefine the edges by a first-order formula

$$\varphi(x, y) = \neg E(x, y) \quad (\text{complement})$$

$$\varphi(x, y) = E(x, y) \vee \exists z E(x, z) \wedge E(z, y) \quad (\text{square})$$



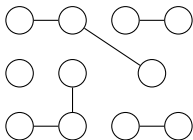
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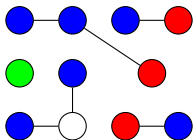
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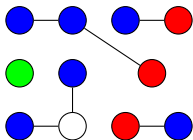
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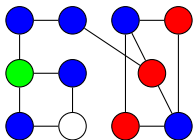
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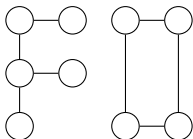
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## Dependence and monadic dependence

A class  $\mathcal{C}$  is

**dependent**, if the hereditary closure of every interpretation of  $\mathcal{C}$  misses some graph

**monadically dependent**, if every transduction of  $\mathcal{C}$  misses some graph [Baldwin, Shelah '85]

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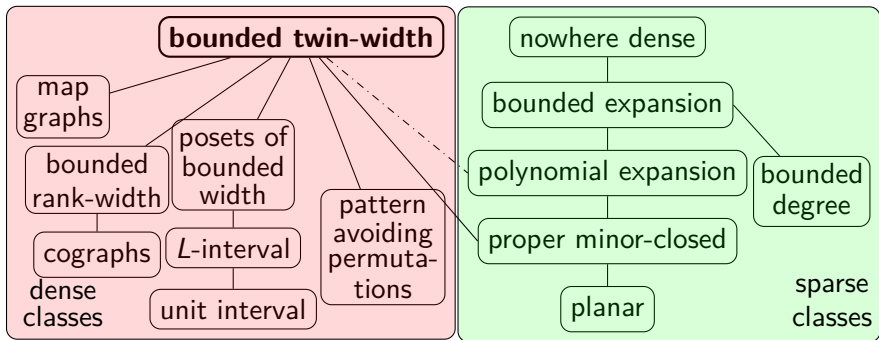
Thus unlikely tractable on *effectively* independent class

Conjecture (Gajarský et al. '18)

*Every dependent class is tractable.*



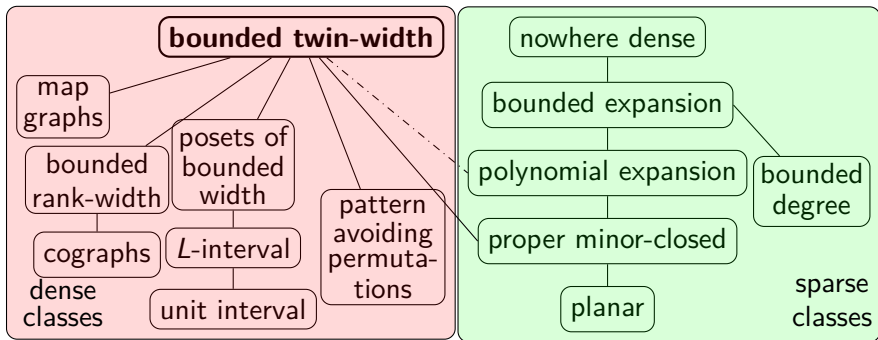
# Known FPT FO model checking



Theorem (B., Kim, Thomassé, Watrigant '20)

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Theorem (B., Kim, Thomassé, Watrigant '20)

*Any transduction of a bounded twin-width class has bounded twin-width.*

## Small classes

Small: class with at most  $n!c^n$  labeled graphs on  $[n]$ .

Theorem (B., Geniet, Kim, Thomassé, Watrigant '21)

*Bounded twin-width classes are small.*

Unifies and extends the same result for:

$\sigma$ -free permutations [Marcus, Tardos '04]

$K_t$ -minor free graphs [Norine, Seymour, Thomas, Wollan '06]

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Subcubic graphs, interval graphs, triangle-free unit segment graphs have **unbounded** twin-width

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Is the converse true for hereditary classes?

Conjecture (small conjecture, refuted)

*A hereditary class has bounded twin-width if and only if it is small.*

## Equivalences for **ordered** graphs

Theorem (B., Giocanti, Ossona de Mendez, Toruńczyk, Thomassé, Simon '21+)

*Let  $\mathcal{C}$  be a hereditary class of ordered graphs, the following are equivalent.*

- (i)  $\mathcal{C}$  has bounded twin-width.*
- (ii)  $\mathcal{C}$  is tractable.*
- (iii)  $\mathcal{C}$  is dependent.*
- (iv)  $\mathcal{C}$  is monadically dependent.*
- (v)  $\mathcal{C}$  has subfactorial growth.*
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**Bounded twin-width is the structural characterization of “easy” ordered binary structures**

## Model-theoretic characterizations

A class of binary structures has bounded **twin-width** if and only if

**Theorem** (B., Nešetřil, Ossona de Mendez, Siebertz, Thomassé '21+)

... it is an *FO transduction of a **proper permutation class***.

rank-width ... tree order

linear rank-width ... linear order



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Theorem (Tww I + Tww IV)

... it is the reduct of a monadically dependent class of ordered binary structures.

## $\chi$ -boundedness

$\mathcal{C}$   $\chi$ -bounded:  $\exists f, \forall G \in \mathcal{C}, \chi(G) \leq f(\omega(G))$

### Theorem

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*More precisely, every graph  $G$  of twin-width at most  $d$  admits a proper  $(d + 2)^{\omega(G)-1}$ -coloring.*

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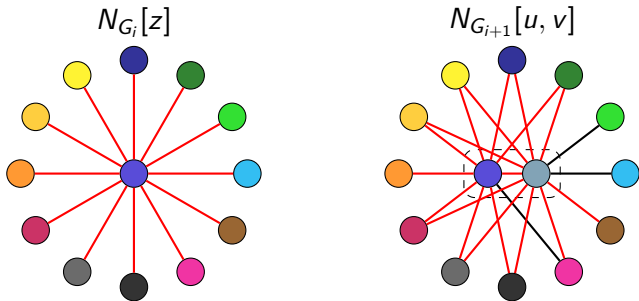
Polynomially  $\chi$ -bounded? i.e.,  $\chi(G) = O(\omega(G)^d)$

## $d + 2$ -coloring in the triangle-free case

Algorithm: **Start from  $G_1 = K_1$ , color its unique vertex 1, and rewind the  $d$ -sequence. A contraction seen backward is a split and we shall find colors for the two new vertices.**

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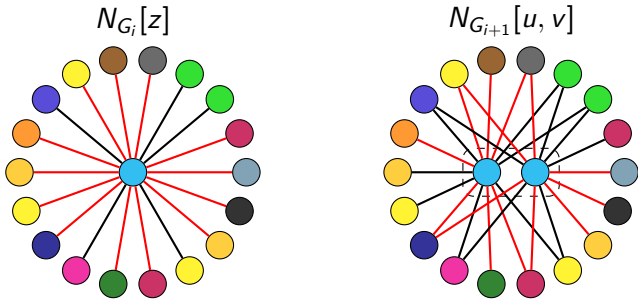
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$z$  has only red incident edges  $\rightarrow d + 2$ -nd color available to  $v$

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$z$  incident to at least one black edge  $\rightarrow$  non-edge between  $u$  and  $v$

## Open questions

- ▶ Algorithm to compute/approximate twin-width in general
- ▶ Fully classify classes with tractable FO model checking
- ▶ Constructions of subcubic unbounded twin-width graphs
- ▶ Better approximations on bounded twin-width classes
- ▶ Polynomial  $\chi$ -boundedness of bounded twin-width classes
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**Thank you for your attention!**