

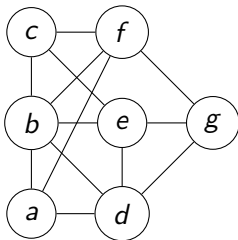
# Twin-width and Sparsity

Édouard Bonnet

ENS Lyon, LIP

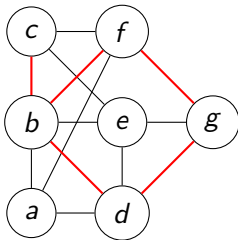
September 29th, 2021, Dagstuhl, Sparsity Tutorial

## Graphs



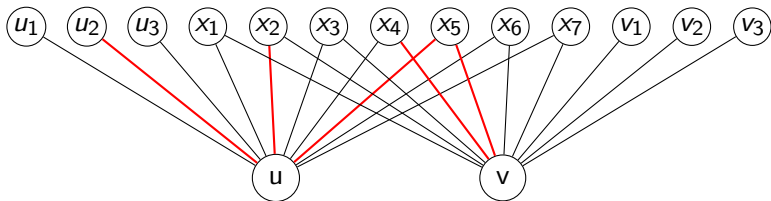
Two outcomes between a pair of vertices:  
edge or non-edge

## Trigraphs



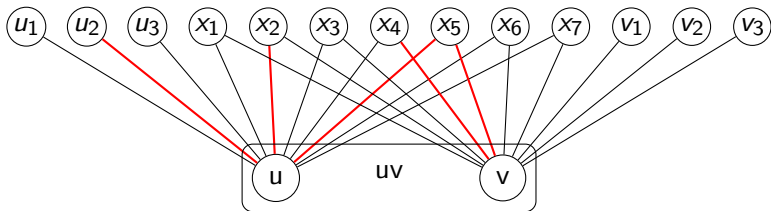
Three outcomes between a pair of vertices:  
edge, or non-edge, or red edge (error edge)

## Contractions in trigraphs



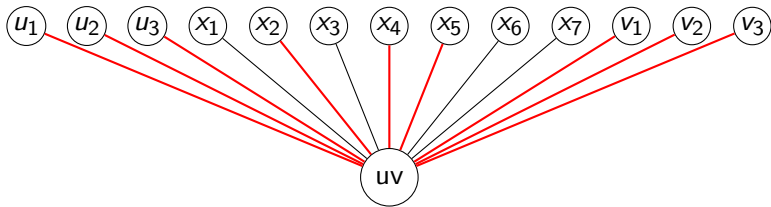
Identification of two non-necessarily adjacent vertices

## Contractions in trigraphs



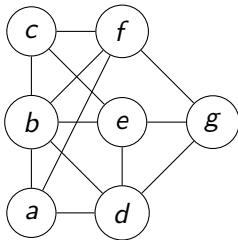
Identification of two non-necessarily adjacent vertices

## Contractions in trigraphs



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

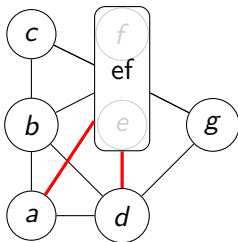
## Contraction sequence



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  $G_{i+1}$ .

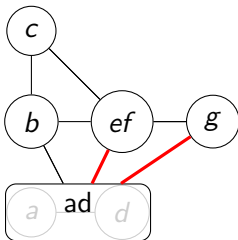
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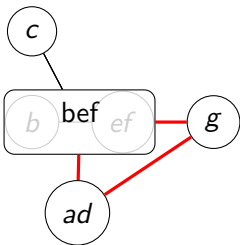


## Contraction sequence



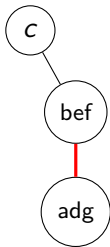
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## Contraction sequence



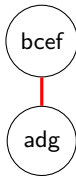
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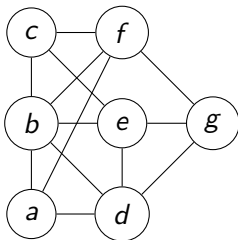


A contraction sequence of  $G$ :

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

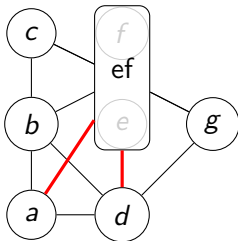
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



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

# Twin-width

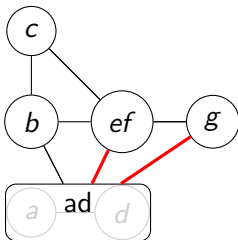
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



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  $d$ .

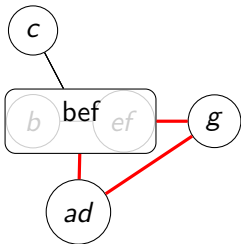


Maximum red degree = 2  
**overall maximum red degree = 2**



## Twin-width

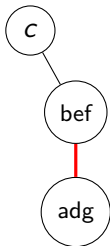
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Maximum red degree = 2  
**overall maximum red degree = 2**

# Twin-width

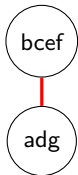
$\text{tw}(G)$ : Least integer  $d$  such that  $G$  admits a contraction sequence where all trigraphs have *maximum red degree* at most  $d$ .



Maximum red degree = 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  $d$ .

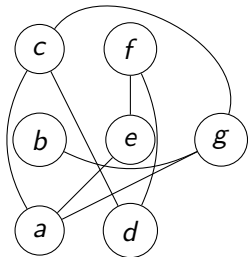


Maximum red degree = 0  
**overall maximum red degree = 2**

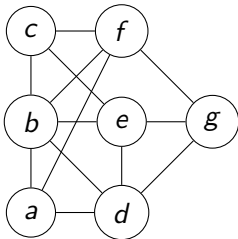
## Simple operations preserving small twin-width

- ▶ complementation: remains the same
- ▶ taking induced subgraphs: may only decrease
- ▶ adding one vertex linked arbitrarily: at most “doubles”
- ▶ substitution, lexicographic product: max of the twin-widths

## Complementation



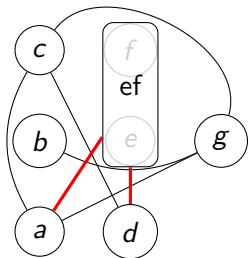
$\overline{G}$



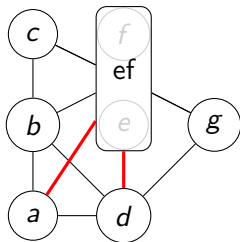
$G$

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

# Complementation



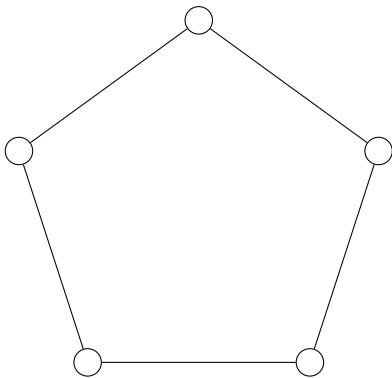
$\overline{G_6}$



$G_6$

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

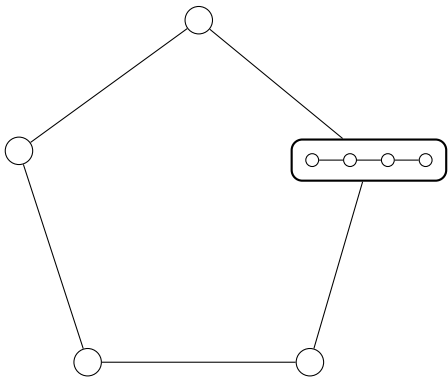
## Substitution and lexicographic product



$$G = C_5$$

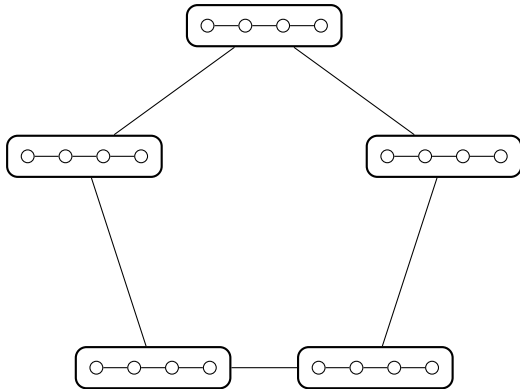


## Substitution and lexicographic product



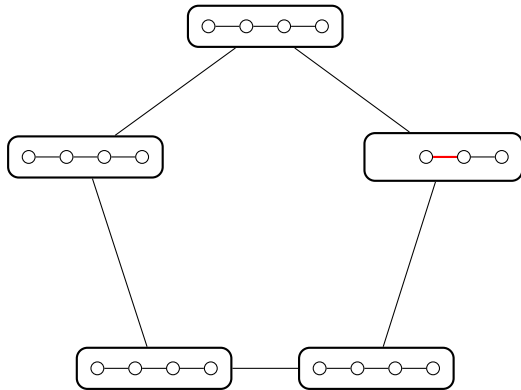
$G = C_5$ ,  $H = P_4$ , substitution  $G[v \leftarrow H]$

## Substitution and lexicographic product



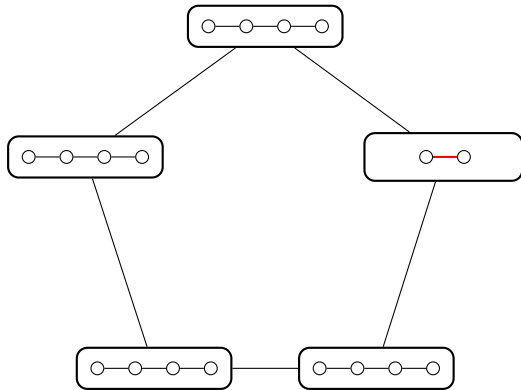
$G = C_5, H = P_4, \text{ lexicographic product } G[H]$

## Substitution and lexicographic product



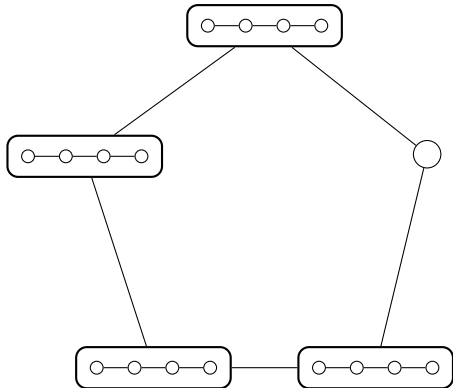
More generally any modular decomposition

## Substitution and lexicographic product



More generally any modular decomposition

## Substitution and lexicographic product

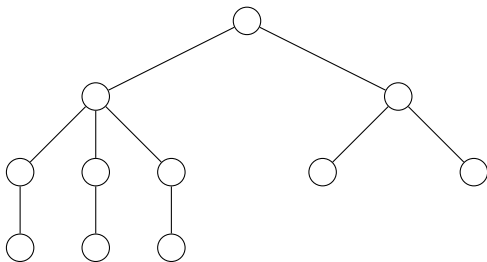


$$\text{tww}(G[H]) = \max(\text{tww}(G), \text{tww}(H))$$

## Classes with bounded twin-width

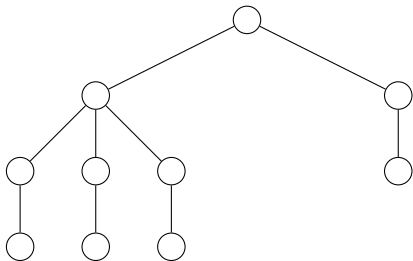
- ▶ cographs = twin-width 0
- ▶ trees, bounded treewidth, clique-width/rank-width
- ▶ grids
- ▶ ...

# Trees



If possible, contract two twin leaves

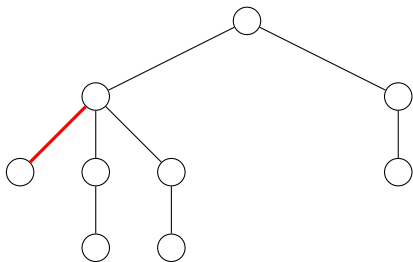
# Trees



If not, contract a deepest leaf with its parent

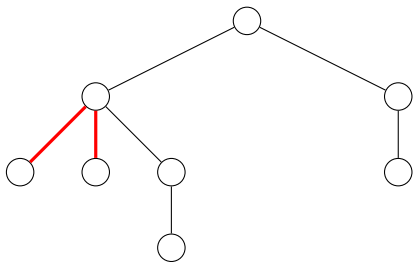


# Trees



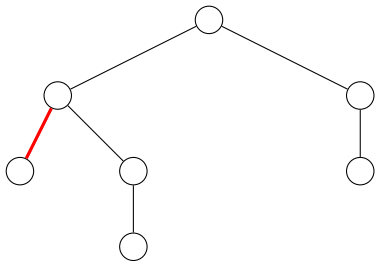
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# Trees



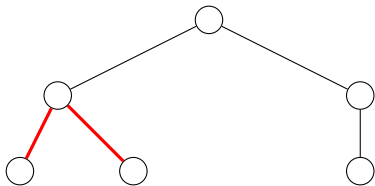
If possible, contract two twin leaves

# Trees



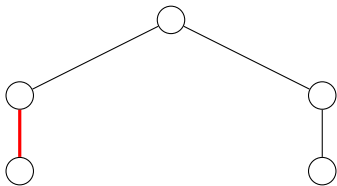
Cannot create a red degree-3 vertex

# Trees



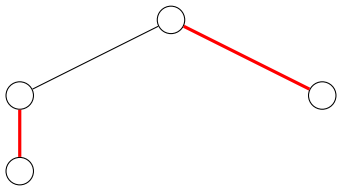
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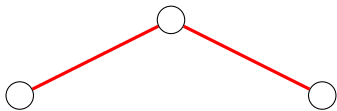
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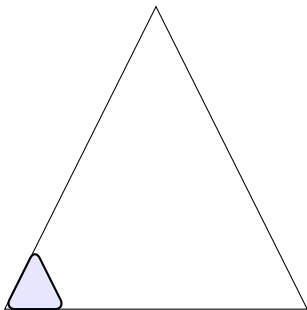


# Trees



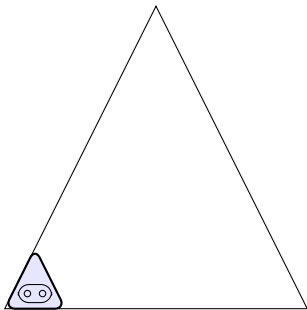
Cannot create a red degree-3 vertex

## Bounded rank-width graphs



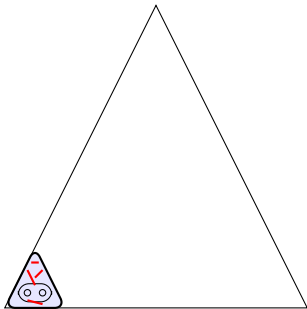
Generalization to bounded *rank-width*

## Bounded rank-width graphs



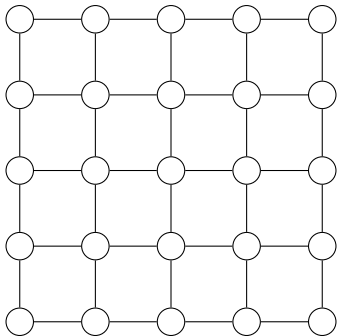
Two twins with respect to the exterior in a small subtree  $\rightarrow$   
contraction

## Bounded rank-width graphs

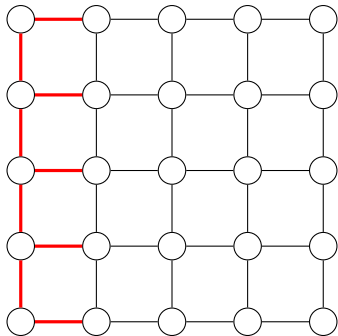


Red edges cluster in bounded size components

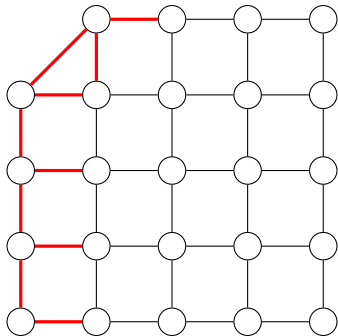
# Grids



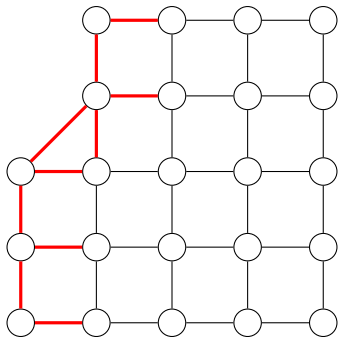
# Grids



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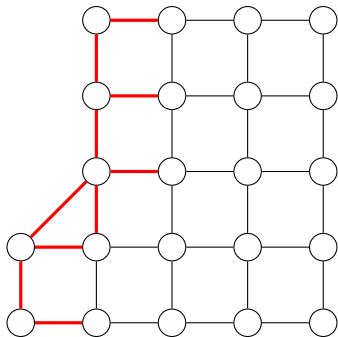


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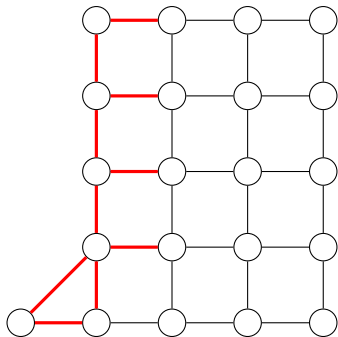




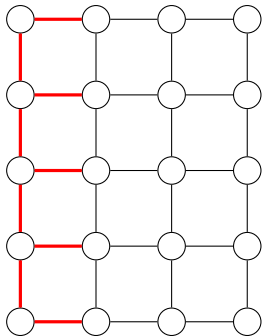
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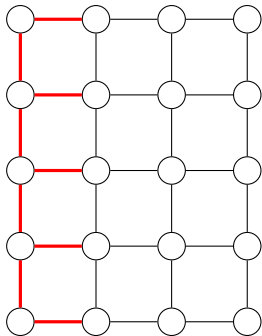


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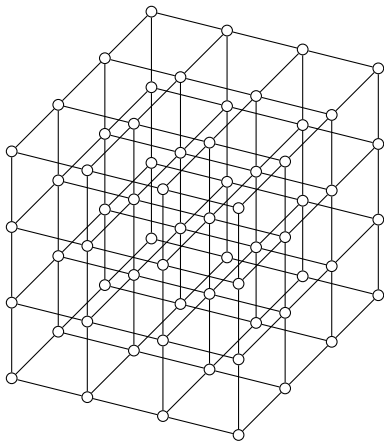
4-sequence for planar grids

## Grids



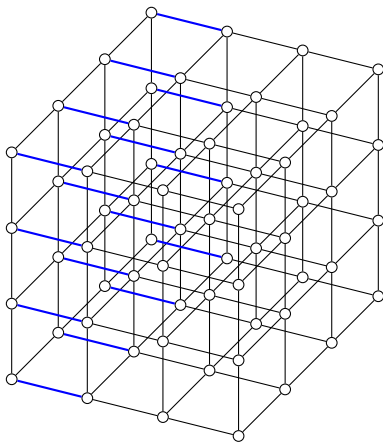
More generally: if a “parallel” contraction of disjoint vertex pairs go from *red degree*  $d$  to *red degree*  $d$ , then any sequentialization has red degree at most  $2d$

## 3-dimensional grids



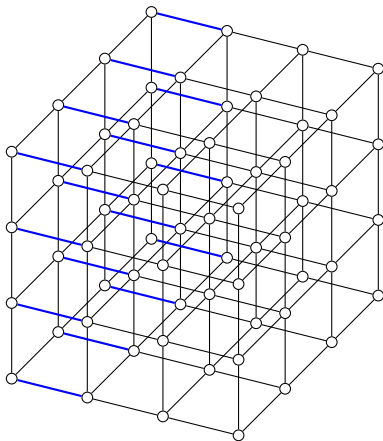
Still bounded degree but contains arbitrary large clique minors

## 3-dimensional grids



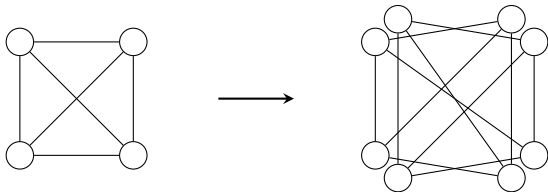
Contract the blue edges in any order  $\rightarrow$  12-sequence

## 3-dimensional grids



The  $d$ -dimensional grid has twin-width  $\leq 4d$  (even  $3d$ )

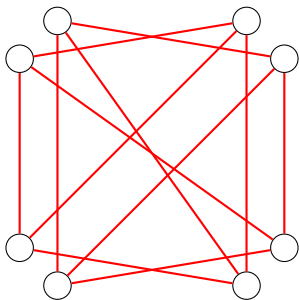
## 2-lifts, expanders with bounded twin-width



split each vertex in 2, replace each edge by 1 of the 2 matchings

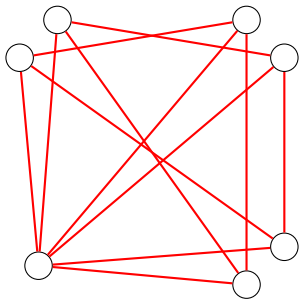


2-lifts, expanders with bounded twin-width



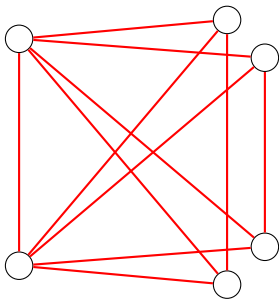
Iterated 2-lifts of  $K_4$  have twin-width at most 6

2-lifts, expanders with bounded twin-width



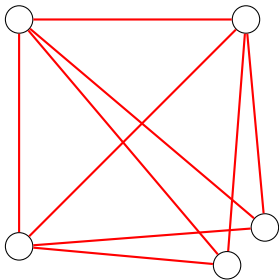
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2-lifts, expanders with bounded twin-width



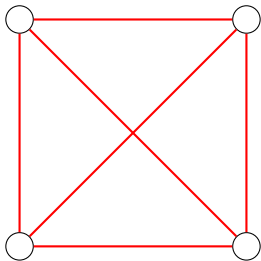
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2-lifts, expanders with bounded twin-width



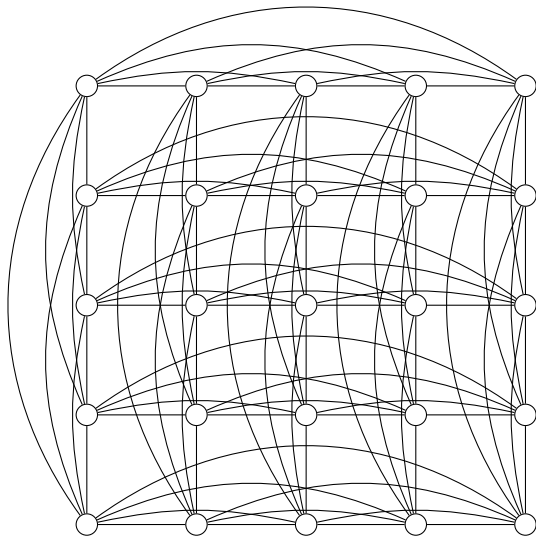
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2-lifts, expanders with bounded twin-width



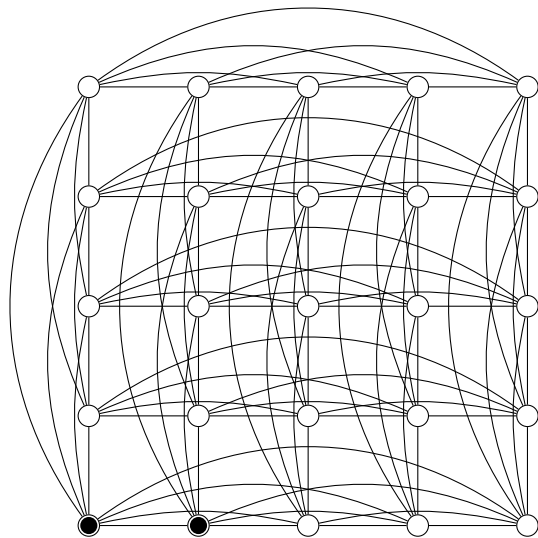
Iterated 2-lifts of  $K_4$  have twin-width at most 6  
but no balanced separators of size  $o(n)$

# First example of unbounded twin-width



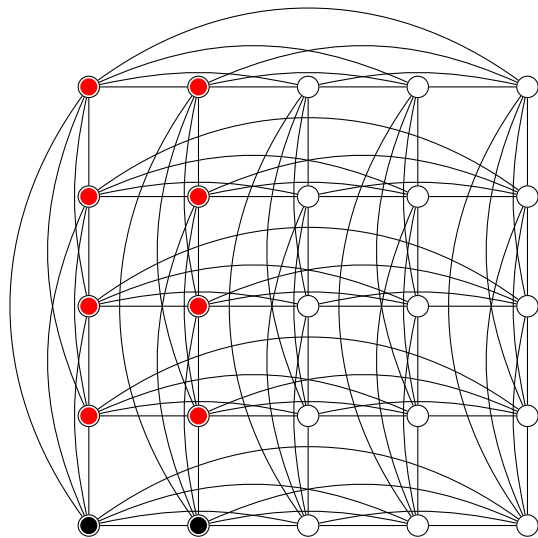
Line graph of a biclique a.k.a. rook graph

# First example of unbounded twin-width



No pair of near twins

# First example of unbounded twin-width



No pair of near twins



# Universal bipartite graph

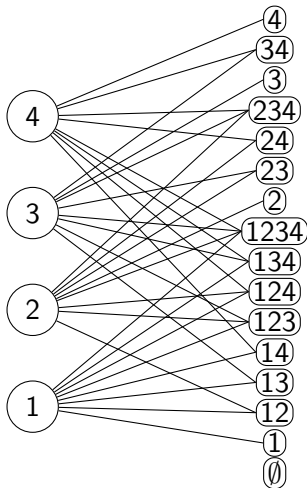
No  $O(1)$ -contraction sequence:

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

# Universal bipartite graph

No  $O(1)$ -contraction sequence:

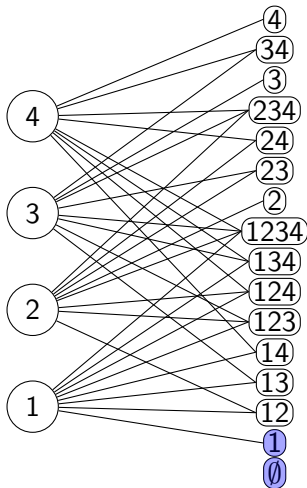
**twin-width is *not* an iterated identification of near twins.**



# Universal bipartite graph

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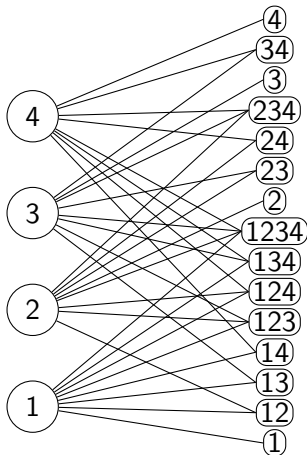
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# Universal bipartite graph

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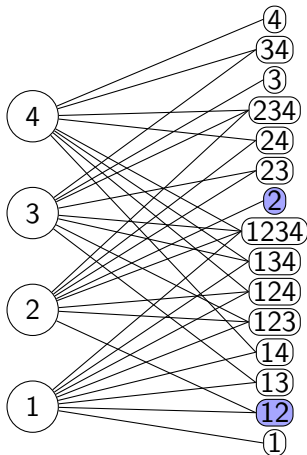
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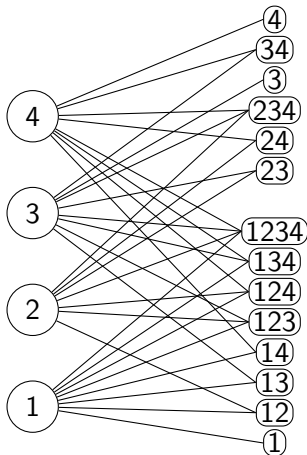
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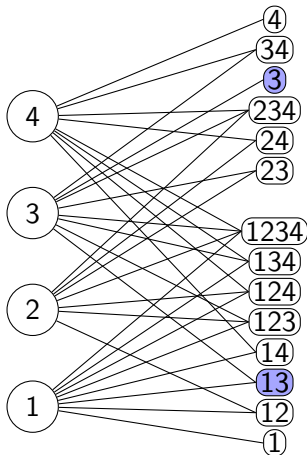
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# Universal bipartite graph

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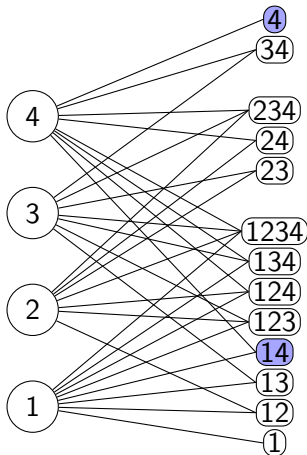
**twin-width is *not* an iterated identification of near twins.**



# Universal bipartite graph

No  $O(1)$ -contraction sequence:

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

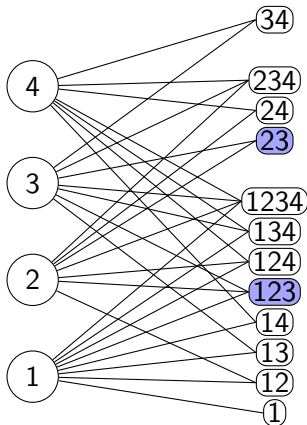




# Universal bipartite graph

No  $O(1)$ -contraction sequence:

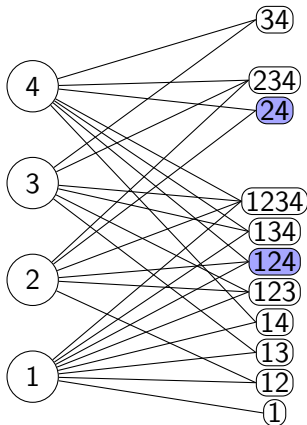
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# Universal bipartite graph

No  $O(1)$ -contraction sequence:

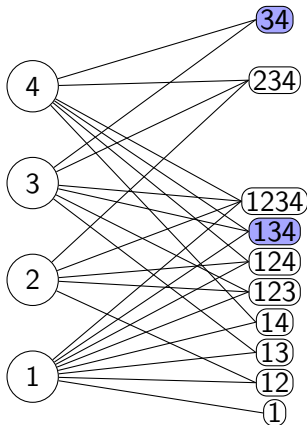
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# Universal bipartite graph

No  $O(1)$ -contraction sequence:

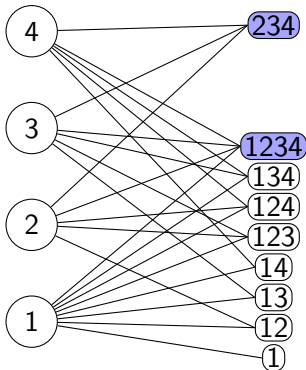
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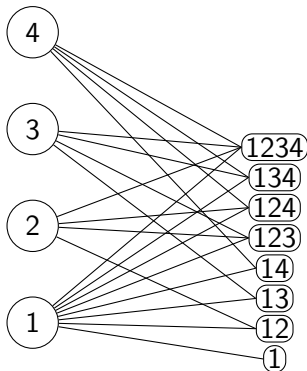
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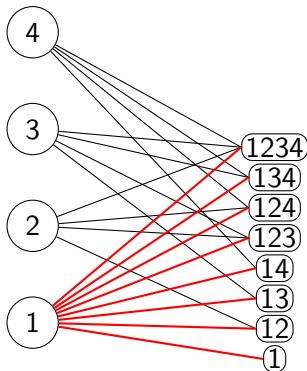
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# Universal bipartite graph

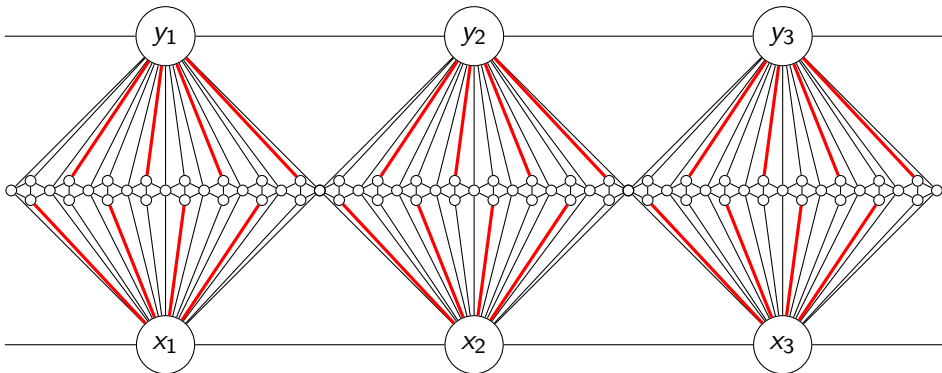
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Planar graphs?

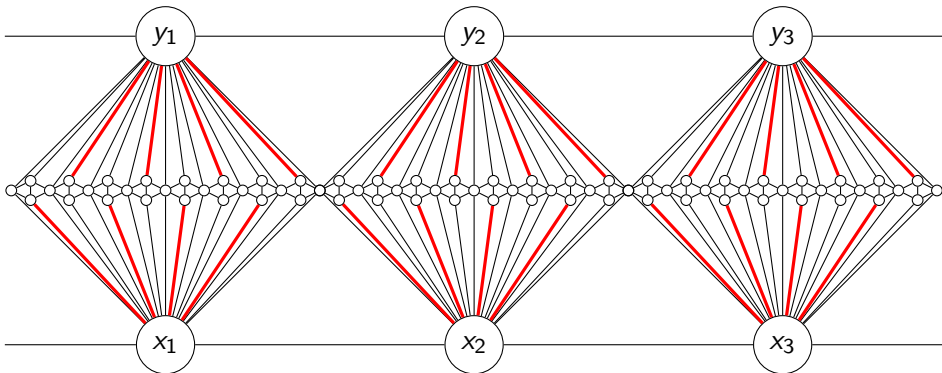
# Planar graphs?



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



## 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	1	1	1	1	1	1	0
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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  
= **error value**

## Partition viewpoint

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

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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

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



## 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

**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

## 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

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

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

3-mixed minor

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

## Mixed value

$R_4$	1	1	1	0	0	1	1	0
$R_3$	1	0	1	0	0	1	0	1
	1	0	1	0	0	0	0	1
$R_2$	0	1	0	0	1	0	1	0
	1	1	0	0	1	0	1	0
$R_1$	0	1	1	1	0	1	0	0
	1	0	1	0	1	0	0	1
			$C_2$					

$\approx$  (maximum) number of cells with a corner per row/column part

## Mixed value

$$\begin{array}{c} R_4 \\ R_3 \\ R_2 \\ R_1 \end{array} \left[ \begin{array}{cc|ccc|cc} 1 & 1 & 1 & 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 1 & 0 & 0 & 1 & 0 & 1 \\ 1 & 0 & 1 & 0 & 0 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ 1 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ 0 & 1 & 1 & 1 & 0 & 1 & 0 & 0 \\ 1 & 0 & 1 & 0 & 1 & 0 & 0 & 1 \end{array} \right]$$

$C_2$

But we add the number of *boundaries* containing a corner



## Mixed value

$$\begin{array}{l} R_4 \\ R_3 \\ \cup \\ R_2 \\ R_1 \end{array} \left[ \begin{array}{cc|ccc|cc} 1 & 1 & 1 & 0 & 0 & 1 & 1 & 0 \\ 1 & 0 & 1 & 0 & 0 & 1 & 0 & 1 \\ 1 & 0 & 1 & 0 & 0 & 0 & 0 & 1 \\ \hline 0 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ 1 & 1 & 0 & 0 & 1 & 0 & 1 & 0 \\ \hline 0 & 1 & 1 & 1 & 0 & 1 & 0 & 0 \\ 1 & 0 & 1 & 0 & 1 & 0 & 0 & 1 \end{array} \right]$$

$C_2$

$\therefore$  merging row parts do not increase mixed value of column part

## 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
1	0	1	1	1	0	0	1

Merge consecutive parts greedily

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0	1	1	1	1	1	0	0
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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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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

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

## Marcus-Tardos theorem

Theorem (Marcus and Tardos '04, Stanley-Wilf conjecture)

*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.*



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*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.*

Auxiliary 0,1-matrix with one entry per cell: a 1 iff the cell is mixed

## 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  $f(t)$**

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	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

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  $\text{tw}(G) = 2^{2^{O(t)}}$ .

**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

## 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  $\text{tw}(G) = 2^{2^{O(t)}}$ .

## Twin-width and mixed freeness

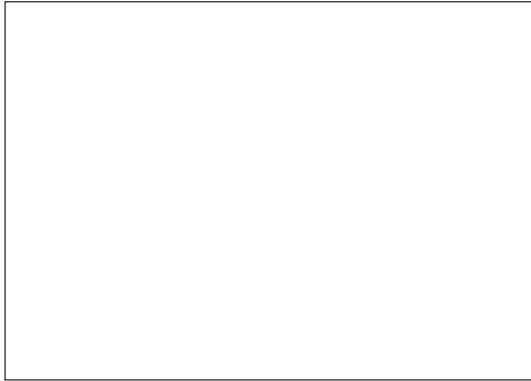
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If  $\exists \sigma$  s.t.  $\text{Adj}_\sigma(G)$  is  $t$ -mixed free, then  $\text{tw}(G) = 2^{2^{O(t)}}$ .

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  $\mathcal{C}$

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

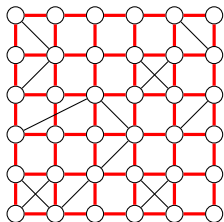
$B_t$	1	1	1	1		1
$B_4$	1	1	1	1		1
$B_3$	1	1	1	1		1
$B_2$	1	1	1	1		1
$B_1$	1	1	1	1		1
	$A_1$	$A_2$	$A_3$	$A_4$		$A_t$

Instead we use a specially crafted lex-DFS discovery order

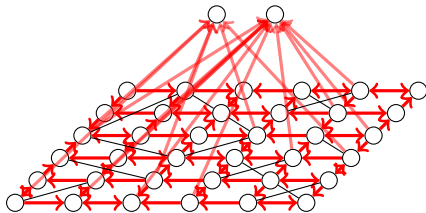
# A surprising and convenient equivalent

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

*Twin-width and oriented twin-width are functionally equivalent.*



red degree

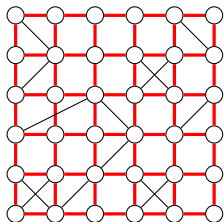


red out-degree  
(red arcs oriented from the contraction)

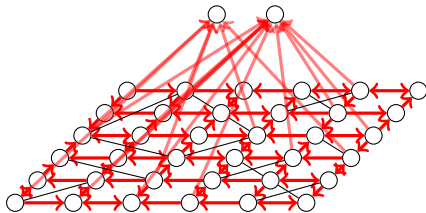
# A surprising and convenient equivalent

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

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red degree



red out-degree  
(red arcs oriented from the contraction)

Theorem (Kotzig's theorem '55)

*Planar graphs have oriented twin-width at most 9.*

## Theorem (B., Geniet, Kim, Thomassé, Watrigant '20 & '21)

*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,*
- ▶ *cubic expanders defined by iterative random 2-lifts from  $K_4$ ,*
- ▶ *strong products of two bounded twin-width classes, one with bounded degree, etc.*

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

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- ▶ *strong products of two bounded twin-width classes, one with bounded degree, etc.*

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

## One cograph definition

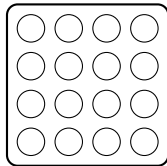
Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*

---

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

## One cograph definition

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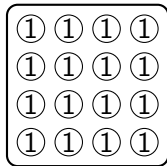
**Is there another algorithmic scheme based on this definition?**

---

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

## One 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

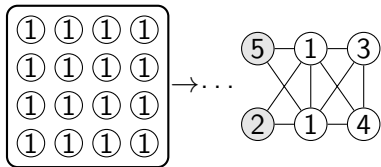
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Cographs form the unique *maximal hereditary* class in which every<sup>1</sup> graph has two *twins*



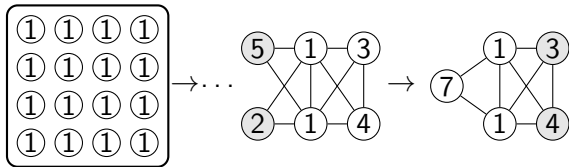
We can find a pair of false/true twins

---

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

## One cograph definition

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



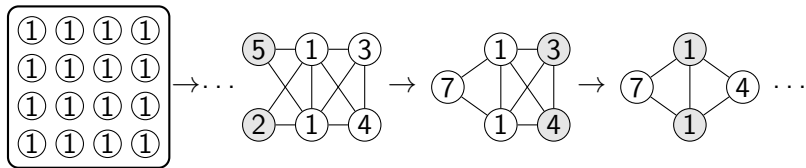
Sum them if they are false twins

---

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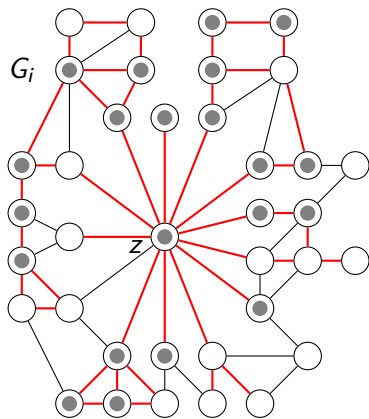
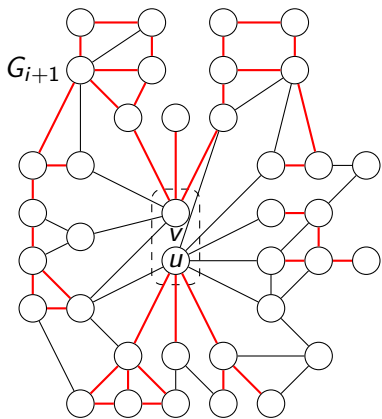
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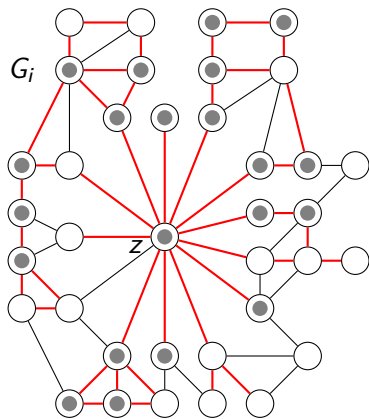
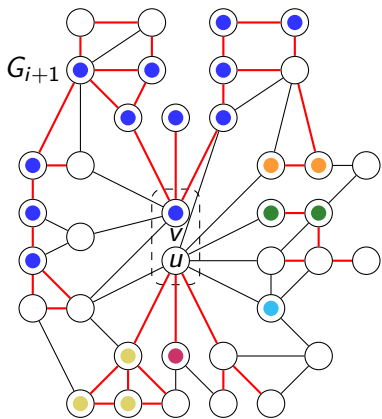
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**How to go from the partial solutions of  $G_{i+1}$  to those of  $G_i$ ?**



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

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

- ▶  $k$ -INDEPENDENT SET,
- ▶  $k$ -CLIQUE,
- ▶  $(r, k)$ -SCATTERED SET,
- ▶  $k$ -DOMINATING SET, and
- ▶  $(r, k)$ -DOMINATING SET

can be solved in time  $2^{O(k)} n$ ,

whereas SUBGRAPH ISOMORPHISM and INDUCED SUBGRAPH ISOMORPHISM can be solved in time  $2^{O(k \log k)} n$ .

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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  $\varphi \in FO(\{E\})$

**Question:**  $G \models \varphi?$

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$$\varphi = \exists x_1 \exists x_2 \cdots \exists x_k \forall x \bigvee_{1 \leq i \leq k} x = x_i \vee \bigvee_{1 \leq i \leq k} E(x, x_i) \vee E(x_i, x)$$

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Example:

$$\varphi = \exists x_1 \exists x_2 \cdots \exists x_k \bigwedge_{1 \leq i < j \leq k} \neg(x_i = x_j) \wedge \neg E(x_i, x_j) \wedge \neg E(x_j, x_i)$$

$$G \models \varphi? \Leftrightarrow$$

## First-order model checking on graphs

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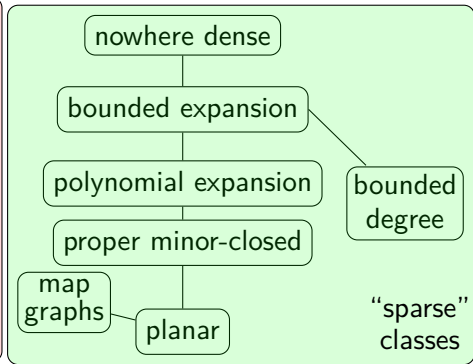
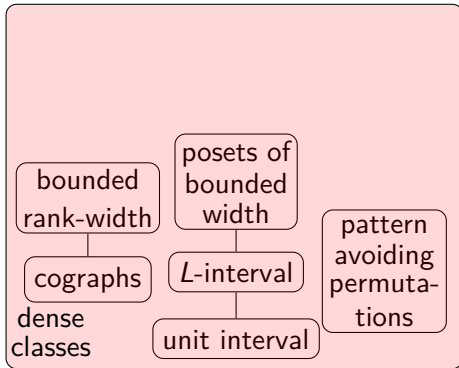
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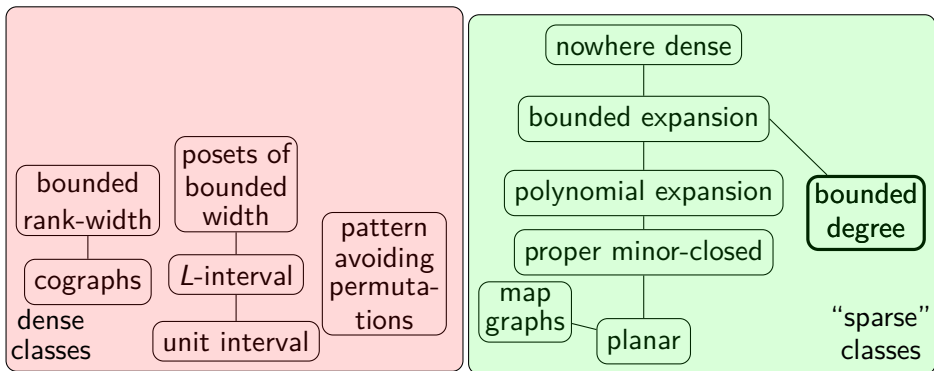
$G \models \varphi? \Leftrightarrow k$ -INDEPENDENT SET



## Classes with known tractable FO model checking

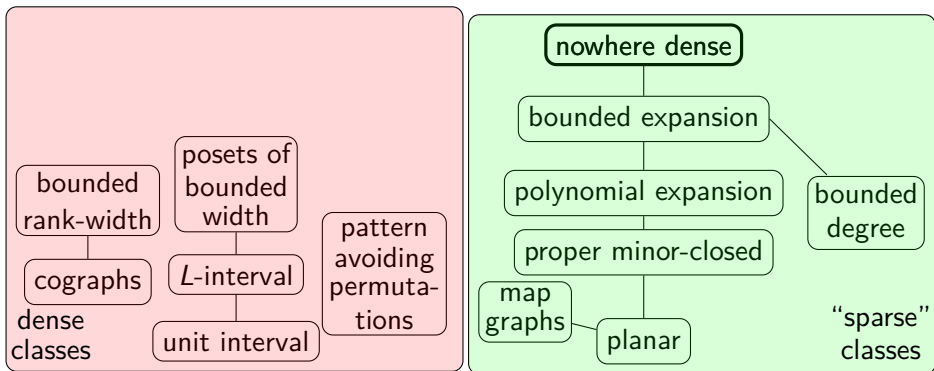


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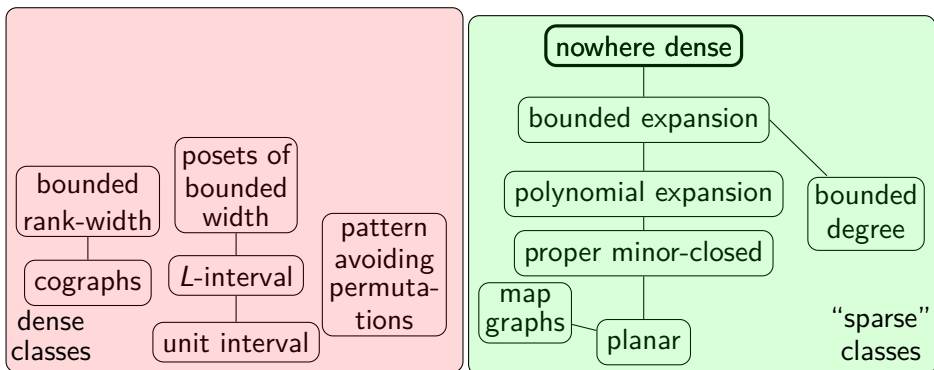
FO MODEL CHECKING solvable in  $f(|\varphi|)n$  on bounded-degree graphs  
[Seese '96]

## Classes with known tractable FO model checking



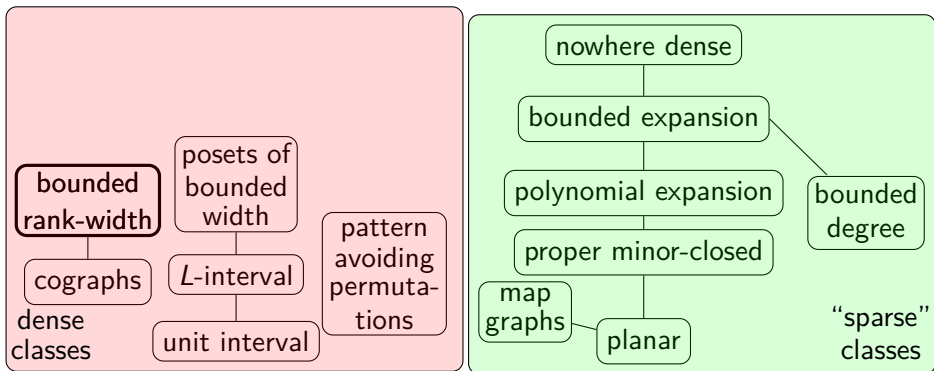
FO MODEL CHECKING solvable in  $f(|\varphi|)n^{1+\varepsilon}$  on any nowhere dense class  
[Grohe, Kreutzer, Siebertz '14]

## Classes with known tractable FO model checking



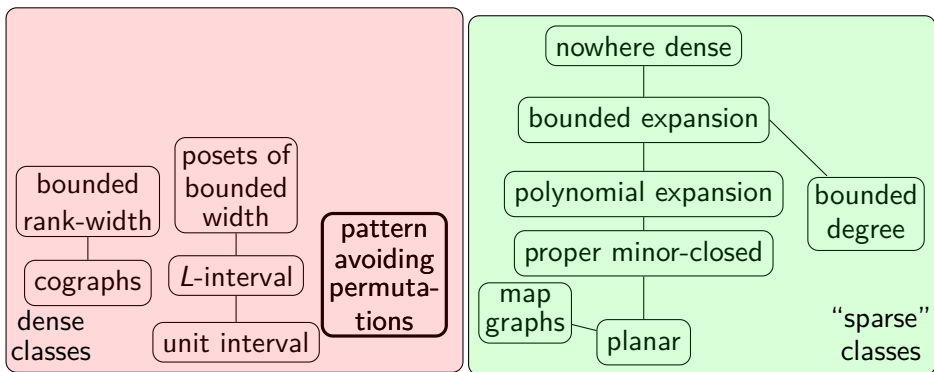
End of the story for the subgraph-closed classes  
tractable FO MODEL CHECKING  $\Leftrightarrow$  nowhere dense

## Classes with known tractable FO model checking



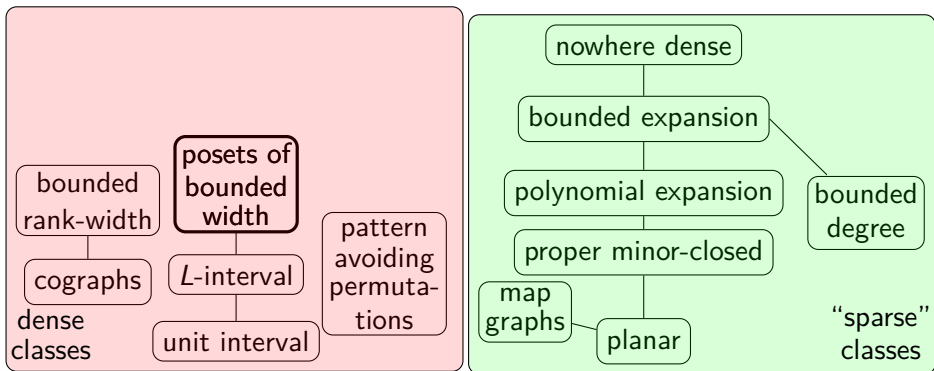
$\text{MSO}_1$  MODEL CHECKING solvable in  $f(|\varphi|, w)n$  on graphs of rank-width  $w$   
[Courcelle, Makowsky, Rotics '00]

## Classes with known tractable FO model checking



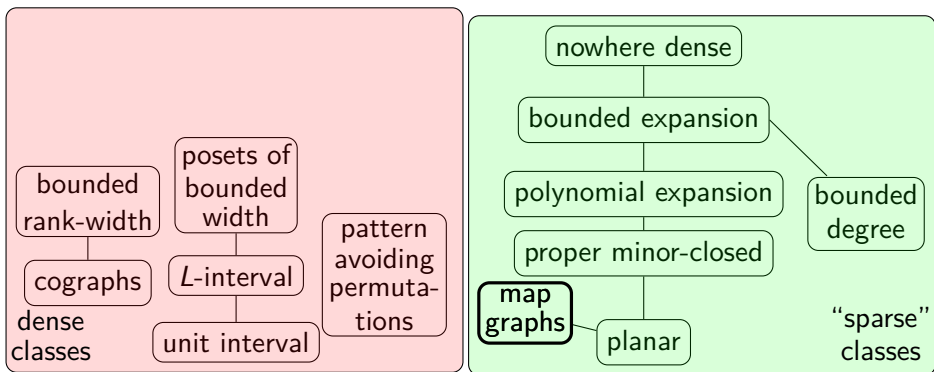
*Is  $\sigma$  a subpermutation of  $\tau$ ?* solvable in  $f(|\sigma|)|\tau|$   
[Guillemot, Marx '14]

## Classes with known tractable FO model checking



FO MODEL CHECKING solvable in  $f(|\varphi|, w)n^2$  on posets of width  $w$   
[GHLOORS '15]

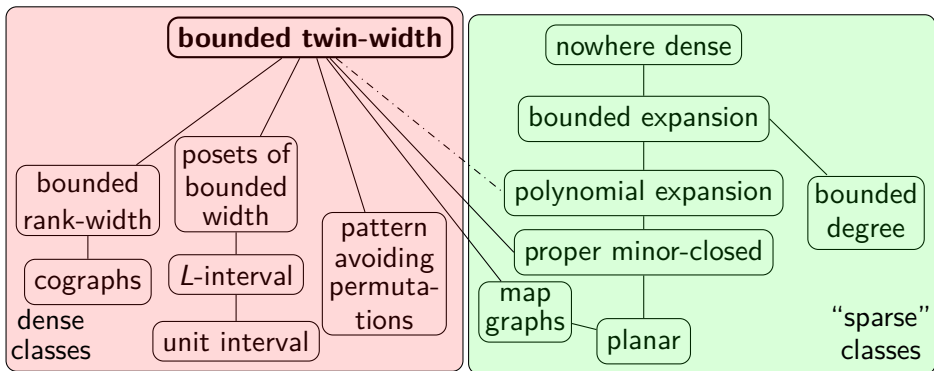
## Classes with known tractable FO model checking



FO MODEL CHECKING solvable in  $f(|\varphi|)n^{O(1)}$  on map graphs  
[Eickmeyer, Kawarabayashi '17]

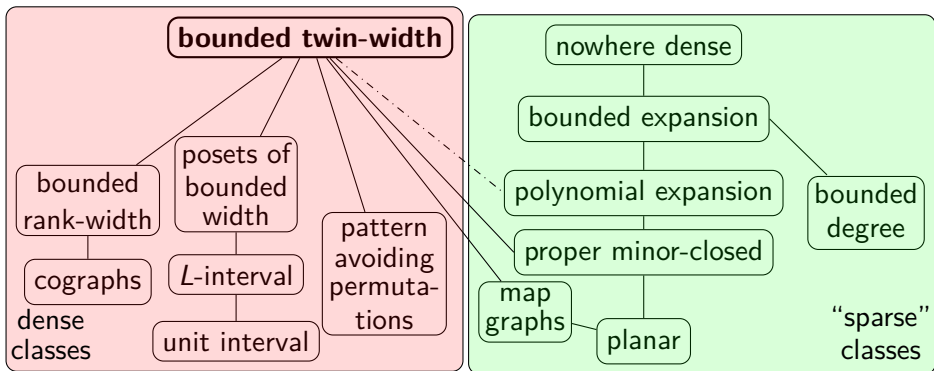


## Classes with known tractable FO model checking



FO MODEL CHECKING solvable in  $f(|\varphi|, d)n$  on graphs with a  $d$ -sequence  
[B., Kim, Thomassé, Watrigant '20]

## Classes with known tractable FO model checking



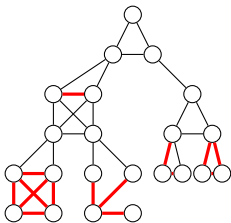
Every transduction of a bounded twin-width class has bounded twin-width  
[B., Kim, Thomassé, Watrigant '20]

# Classic width-measures via contraction sequences

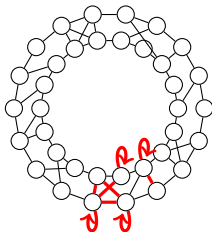
Theorem (B., Kim, Reinald, Thomassé '21+)

*Component twin-width is functionally equivalent to rank-width.*

*Total twin-width is functionally equivalent to linear rank-width.*



Component twin-width:  
max red component size



Total twin-width:  
max number of red edges

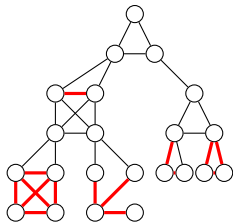
The sparse regime captures treewidth and pathwidth

# Classic width-measures via contraction sequences

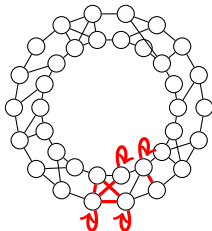
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Alternative proof of Courcelle, Makowsky, Rotics's theorem:  
FO model checking approach using Feferman-Vaught instead of  
Gaifman's theorem

# Sparse classes with bounded twin-width

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

Let  $\mathcal{C}$  a hereditary class of bounded twin-width. TFAE:

- ▶ graphs in  $\mathcal{C}$  have  $d$ -grid free adjacency matrices;
- ▶ graphs in  $\mathcal{C}$  are  $K_{t,t}$ -free;
- ▶ graphs in  $\mathcal{C}$  have linearly many edges;
- ▶ The subgraph-closure of  $\mathcal{C}$  has bounded twin-width;
- ▶  $\mathcal{C}$  has bounded expansion.

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Still an interesting family of classes including bounded queue/stack number,  $K_t$ -minor free, and some expander classes

**Does polynomial expansion imply bounded twin-width?**

## $\chi$ -boundedness

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

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

*Every twin-width class is  $\chi$ -bounded.*

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

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**Are they polynomially  $\chi$ -bounded?** i.e.,  $\chi(G) = O(\omega(G)^d)$

Bounded twin-width graphs do satisfy strong Erdős-Hajnal

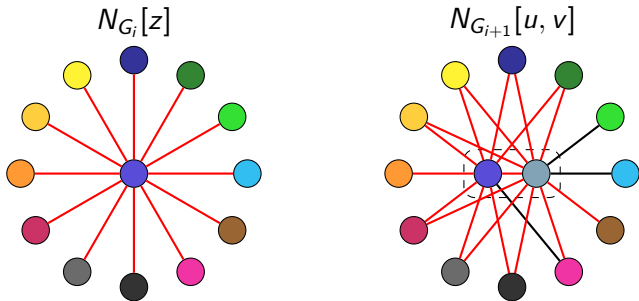


## $d + 2$ -coloring in the triangle-free case

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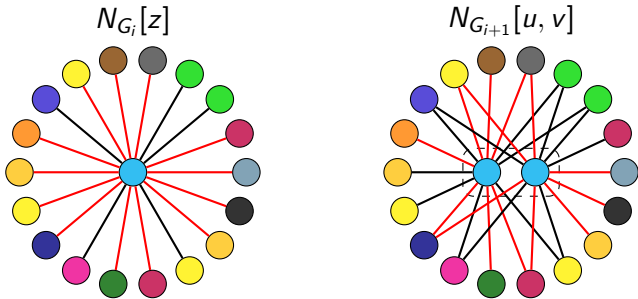
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$z$  has only red incident edges  $\rightarrow d + 2$ -nd color available to  $v$

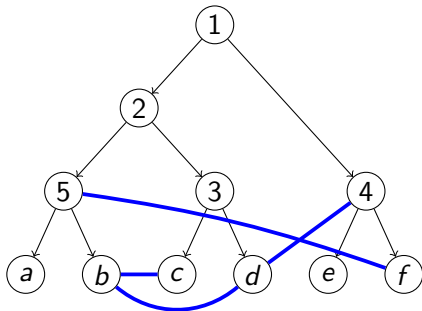
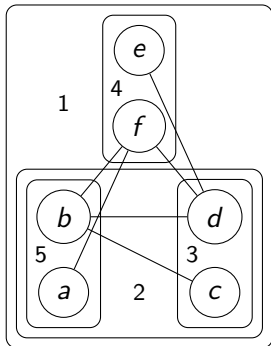
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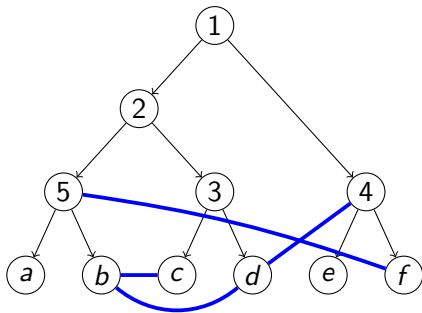
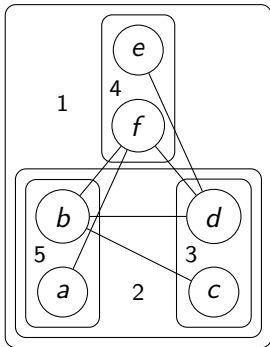
$z$  incident to at least one black edge  $\rightarrow$  non-edge between  $u$  and  $v$

# Twin-decomposition



Sparse model for bounded twin-width graphs  
(degeneracy of the blue graph by orienting)

# Twin-decomposition



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

*A class of binary structures has bounded twin-width if and only if it is an FO transduction of a proper permutation class.*

## Small classes

Small: class with at most  $n!2^{O(n)}$  labeled graphs on  $[n]$ .

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

*Bounded twin-width classes are small.*

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

*...even at most  $2^{O(n)}$  graphs up to isomorphism.*

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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The converse for hereditary classes does not hold

Theorem (B., Geniet, Tessera, Thomassé '21+)

*There is a randomized construction of a finitely-generated group whose hereditary class of finite restrictions of the Cayley graph has unbounded twin-width (and yet is small).*



## The case of ordered binary structures

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

Let  $\mathcal{C}$  be a hereditary class of ordered graphs. TFAE:

- (1)  $\mathcal{C}$  has bounded twin-width;
- (2)  $\mathcal{C}$  is monadically dependent;
- (3)  $\mathcal{C}$  is dependent;
- (4)  $\mathcal{C}$  contains  $2^{O(n)}$  ordered  $n$ -vertex graphs;
- (5)  $\mathcal{C}$  contains less than  $\sum_{k=0}^{\lfloor n/2 \rfloor} \binom{n}{2k} k!$  ordered  $n$ -vertex graphs;
- (6)  $\mathcal{C}$  does not include one of 24 minimal hereditary classes of ordered graphs with unbounded twin-width.
- (7) FO-model checking is fixed-parameter tractable on  $\mathcal{C}$ .

## Open questions

Algorithm to compute/approximate twin-width in general

Explicit examples of bounded-degree graphs of unbounded twin-width

Fully classify classes with tractable FO model checking

Some more classes could have bounded twin-width: polynomial expansion,  $K_{t,t}$ -free string graphs, etc.

Could smallness alone be algorithmically exploitable?