# Forbidden submatrices

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July 9, 2020

# Forbidden submatrices

- Only 0-1 matrices in this talk
- ▶ Notation: 1s as •, 0s omitted:

$$\begin{pmatrix} 1 & 0 & 0 \\ 0 & 1 & 1 \\ 0 & 1 & 1 \end{pmatrix} \rightarrow \begin{pmatrix} \bullet & & \\ & \bullet & \bullet \\ & \bullet & \bullet \end{pmatrix}$$

No empty rows/columns

A 0-1 matrix M contains a 0-1 matrix P if P can be obtained from M by deleting rows, columns, and turning 1s into 0s.

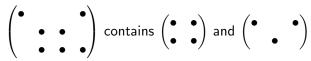
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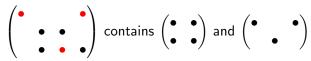
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► 
$$E_x(n, (\bullet)) = 0$$
  
►  $E_x(n, (\bullet \bullet)) = n$   
►  $E_x(n, (\bullet \bullet)) = 2n, E_x(n, (\bullet \bullet \bullet)) = 3n, ...$   
►  $E_x(n, P) \ge n \text{ if } P \ne (\bullet).$ 

The weight |M| of a 0-1 matrix M is the number of 1-entries in it. Let  $E_X(n, P)$  be the maximum weight in a  $n \times n$  0-1 matrix avoiding P.

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• 
$$\mathsf{Ex}(n, P) \ge n \text{ if } P \neq (\bullet).$$

What other matrix patterns are linear? [Füredi and Hajnal 1992; Keszegh 2009]

Use *reductions* between matrix patterns:

► Rotation and reflection doesn't change anything, e.g.  

$$Ex(n, \begin{pmatrix} \bullet \\ \bullet \end{pmatrix}) = Ex(n, (\bullet \quad \bullet)),$$

$$Ex(n, \begin{pmatrix} \bullet & \bullet \\ \bullet & \bullet \end{pmatrix}) = Ex(n, \begin{pmatrix} \bullet & \bullet \\ \bullet & \bullet \end{pmatrix})$$

Use *reductions* between matrix patterns:

▶ Rotation and reflection doesn't change anything, e.g. Ex(n, (●)) = Ex(n, (●)), Ex(n, (●)) = Ex(n, (●)))
 ▶ Removing a 1-entry can only reduce Ex(n, P), e.g. Ex(n, (●)) ≥ Ex(n, (●)))

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$$E_{x}(n, \begin{pmatrix} \bullet \\ \bullet \end{pmatrix}) \leq 2n.$$
  
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 $\blacktriangleright$  Remove the highest 1-entry in each column  $\rightarrow M'$ 

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Idea: Adding a 1-entry at the "boundary" of P does not increase Ex very much.

**Lemma.** [Füredi and Hajnal 1992] Let P be a matrix pattern. Consider a 1 in the topmost row of P, and add a 1 directly above it to obtain P'.

Then  $Ex(n, P) \leq Ex(n, P') + n$ .

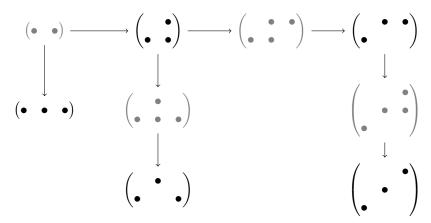
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$$\blacktriangleright \text{ Example:} \begin{pmatrix} ? & ? & \bullet & ? \\ ? & ? & ? & ? \\ ? & ? & ? & ? \end{pmatrix} \rightarrow \begin{pmatrix} \bullet & \bullet \\ ? & ? & \bullet & ? \\ ? & ? & \bullet & ? \\ ? & ? & ? & ? \\ ? & ? & ? & ? \end{pmatrix}$$

 Types of reduction: rotation/reflection, removing 1-entry, adding 1-entry at boundary.

All weight-3 patterns are linear.



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- 3 more are linear. [Tardos 2005]
- The rest are non-linear:  $\Theta(n\alpha(n))$ ,  $\Theta(n \log n)$ , or  $\Theta(n^{3/2})$ .

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- More reductions are known [Keszegh 2009]
- Weight-5 patterns not completely understood.

#### Large patterns

# • Light patterns (one entry per column): $2^{\alpha^{\Theta(1)}(n)}n$ .

[Klazar 2001; Keszegh 2009]

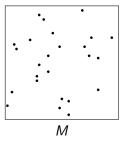
#### Large patterns

- Light patterns (one entry per column): 2<sup>αΘ(1)</sup>(n) n.
   [Klazar 2001; Keszegh 2009]
- Füredi-Hajnal conjecture: Permutation matrices (one entry per row and column) are linear.
  - Implies the Stanley-Wilf conjecture [Martin Klazar 2000]
  - Proven in 2004 by Marcus and Tardos.

# Marcus-Tardos Theorem

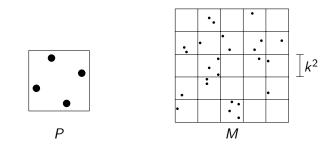
**Theorem.** If *P* is a  $k \times k$  permutation matrix, then  $E_x(n, P) \in \mathcal{O}(n)$ . [Marcus and Tardos 2004; Zeilberger 2003]





# Marcus-Tardos Theorem

**Theorem.** If *P* is a  $k \times k$  permutation matrix, then  $E_x(n, P) \in \mathcal{O}(n)$ . [Marcus and Tardos 2004; Zeilberger 2003]



• Divide *M* into a grid of  $k^2 \times k^2$  cells.

- A heavy cell has  $> (k-1)^2$  entries and is...
  - high if it has entries in  $\geq k$  distinct rows;
  - wide if it has entries in  $\geq k$  distinct columns.



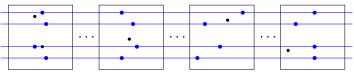
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- Claim: At most  $k\binom{k^2}{k}$  high cells per grid row.
- High cells have  $\binom{k^2}{k}$  choices for their k rows.



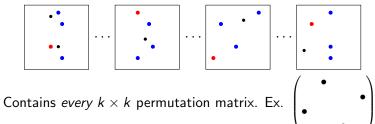
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• Each grid column contains at most  $k\binom{k^2}{k}$  wide cells.

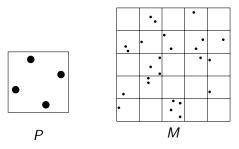
### Marcus-Tardos Theorem – Heavy cells

► Each grid column contains at most k (<sup>k<sup>2</sup></sup><sub>k</sub>) wide cells.
 ► At most 2 <sup>n</sup>/<sub>k<sup>2</sup></sub> k (<sup>k<sup>2</sup></sup><sub>k</sub>) ∈ O(n) heavy cells

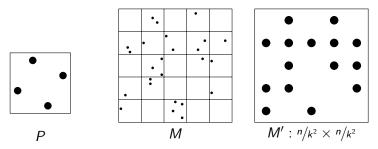
### Marcus-Tardos Theorem – Heavy cells

- Each grid column contains at most  $\binom{k^2}{k}$  wide cells.
- At most  $2\frac{n}{k^2}k\binom{k^2}{k} \in \mathcal{O}(n)$  heavy cells
- At most  $k^4 \in \mathcal{O}(1)$  entries per heavy cell:
- Heavy cells contribute  $\mathcal{O}(n)$  entries.

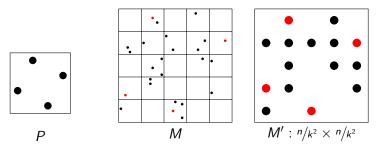
*Light* cells:  $\leq (k-1)^2$  entries. Consider *all* non-empty cells:



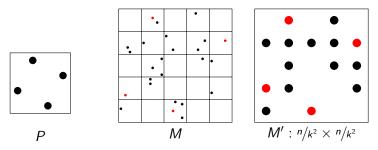
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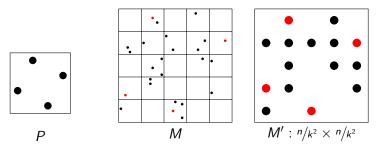


*Light* cells:  $\leq (k-1)^2$  entries. Consider *all* non-empty cells:



• At most  $E_x(n/k^2, P)$  non-empty cells  $\implies$  Light cells contribute  $(k-1)^2 E_x(n/k^2, P)$ .

*Light* cells:  $\leq (k-1)^2$  entries. Consider *all* non-empty cells:



At most Ex(n/k<sup>2</sup>, P) non-empty cells
 ⇒ Light cells contribute (k − 1)<sup>2</sup> Ex(n/k<sup>2</sup>, P).

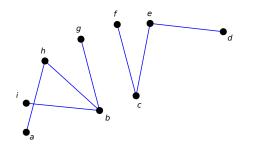
 Ex(n, P) ≤ (k − 1)<sup>2</sup> Ex(n/k<sup>2</sup>, P) + O(n)
 ⇒ Ex(n, P) ∈ O(n).

## Applications I

#### Algorithm for L<sub>1</sub>-shortest paths with polgonal obstacles. [Mitchell 1987]

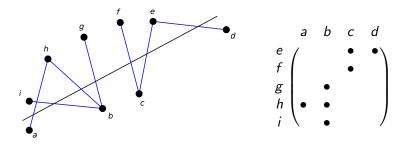
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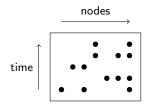
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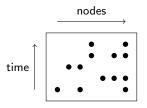
## Applications II

Path compression in trees (e.g. union-find) [Pettie 2010a]



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- Self-adjusting binary search trees (geometric BST model) [Pettie 2010a; Chalermsook et al. 2015; Kozma 2016]
- ... and more in discrete and computational geometry [Pettie 2010b]

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