

The quest for optimality in geometric intersection graphs

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Episode 1: exact algorithms

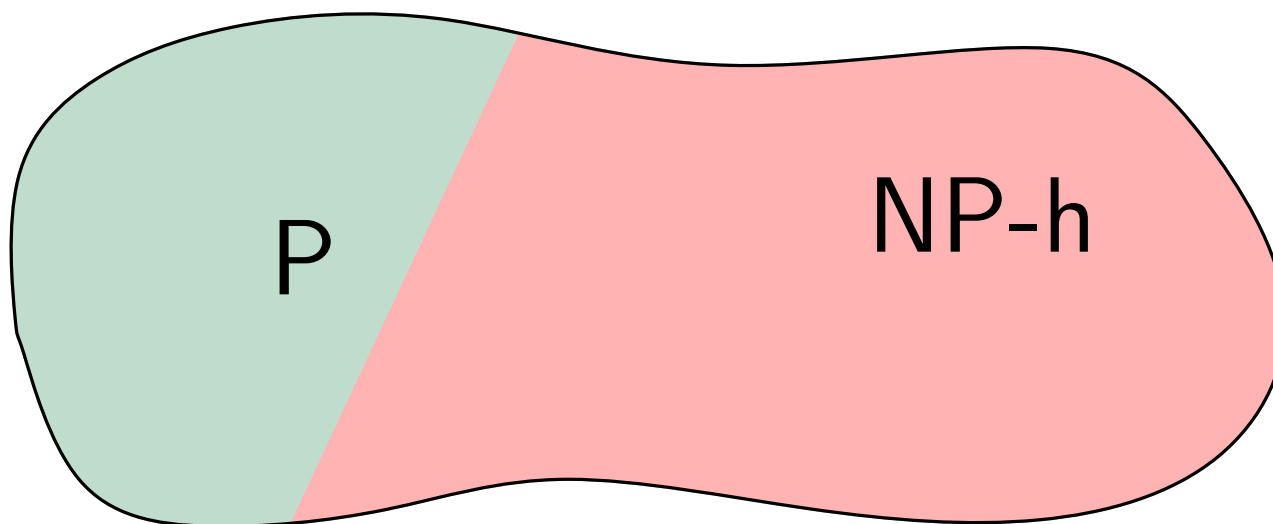
Fine-grained complexity and the Exponential-Time Hypothesis

Classical approach to complexity theory

Assuming $P \neq NP$, we partition problems into two sets:

- ▶ P (solvable in polynomial time)
proven by presenting an algorithm

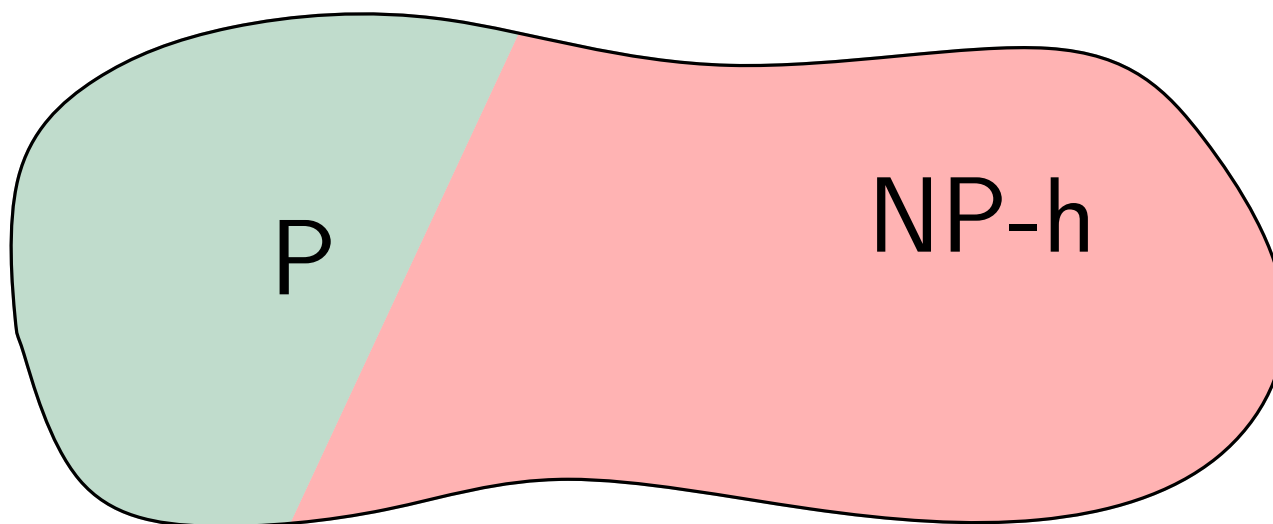
- ▶ NP-hard (no polynomial algorithm)
proven by polynomial reductions



Classical approach to complexity theory

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- ▶ P (solvable in polynomial time)
proven by presenting an algorithm
worth attention,
how fast can be solve them?
- ▶ NP-hard (no polynomial algorithm)
proven by polynomial reductions
hopeless, unsolvable



How hard are hard problems?

- ▶ hard problems are quite common (even in practice)
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Exponential Time Hypothesis (ETH) [Impagliazzo, Paturi, 1999]

There is no algorithm solving 3-SAT with n variables and $\mathcal{O}(n)$ clauses in time $2^{o(n)}$.

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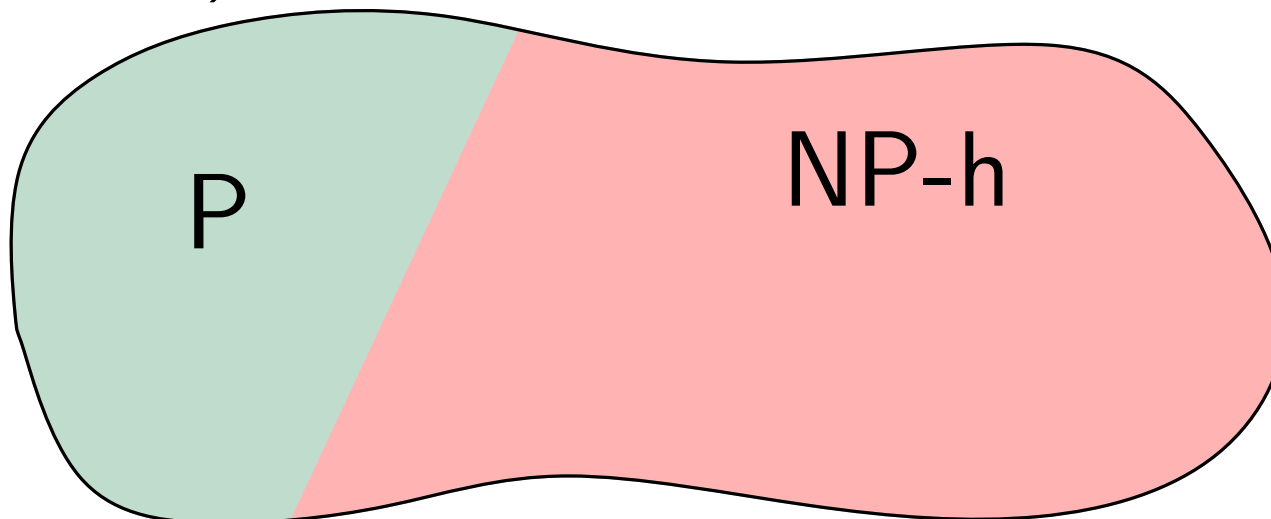
There is no algorithm solving 3-SAT with n variables and $\mathcal{O}(n)$ clauses in time $2^{o(n)}$.

subexponential time: $2^{o(n)}$,
e.g. $2^{\mathcal{O}(n^{0.99})}$ or $2^{\mathcal{O}(n/\log n)}$

A closer look

Being a stronger assumption than $P \neq NP$, ETH allows for a finer analysis:

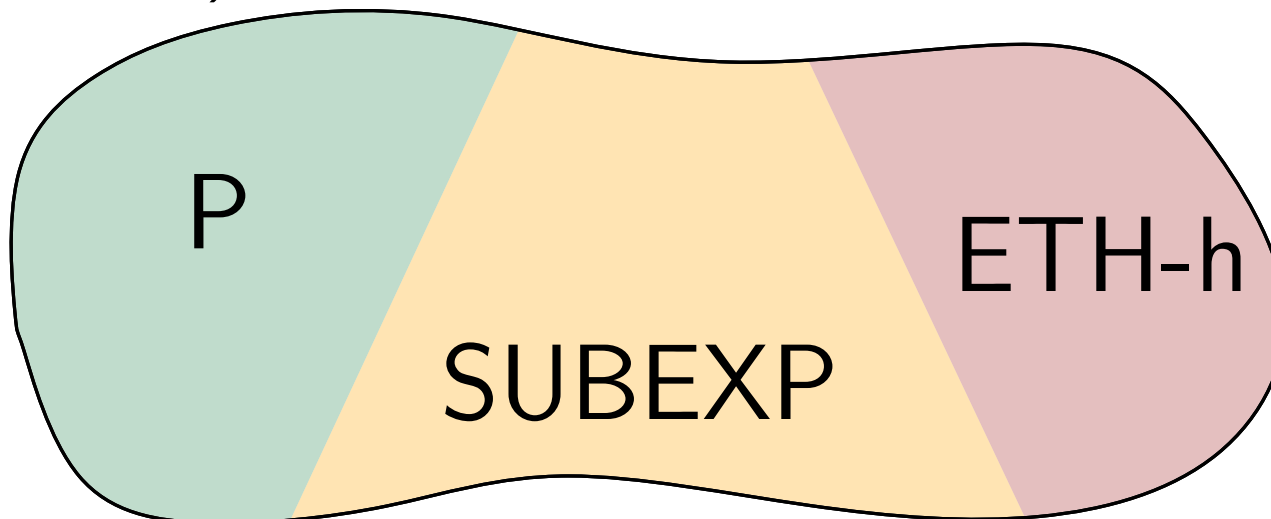
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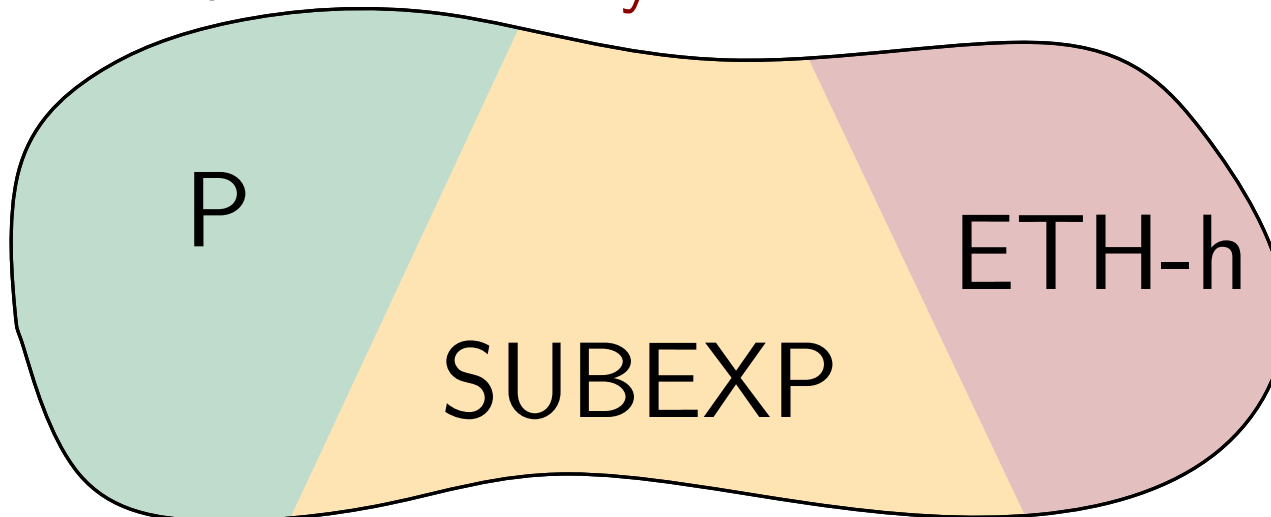
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A closer look

Being a stronger assumption than $P \neq NP$, ETH allows for a finer analysis:

- ▶ P (solvable in polynomial time)
easy
- ▶ NP-hard (no polynomial algorithm)
 - SUBEXP (solvable in subexponential time)
not so super-hard
 - ETH-hard (no subexponential algorithm)
really difficult



Lower bounds

- ▶ hardness is proven via reductions
- ▶ start from 3-SAT with n variables and $m = \mathcal{O}(n)$ clauses
- ▶ construct an instance \mathcal{I} with $N = \mathcal{O}(n^\alpha)$ vertices

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$\alpha = 1$	(linear reduction)	\rightarrow	no $2^{o(n)}$ algorithm
$\alpha = 2$	(quadratic reduction)	\rightarrow	no $2^{o(\sqrt{n})}$ algorithm

What can we hope for?

- ▶ bad news: assuming the ETH, there are no subexponential algorithms for canonical graph problems

3-COLORING, INDEPENDENT SET, CLIQUE, DOMINATING SET, VERTEX COVER, HAMILTONIAN CYCLE, MAX CUT etc.

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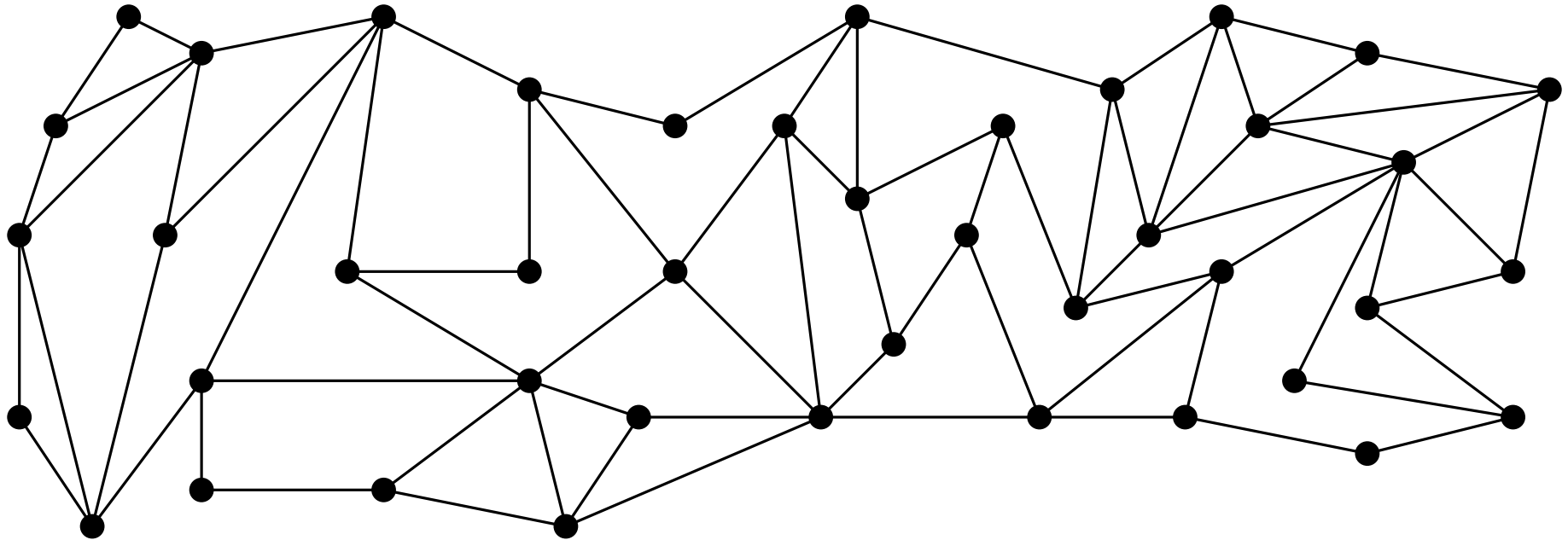
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Subexponential algorithms for planar graphs

Planar separator theorem [Lipton, Tarjan, 1979].

Every planar graph has a balanced separator of size $\mathcal{O}(\sqrt{n})$.

- ▶ also specialized versions, e.g. the separator is a cycle



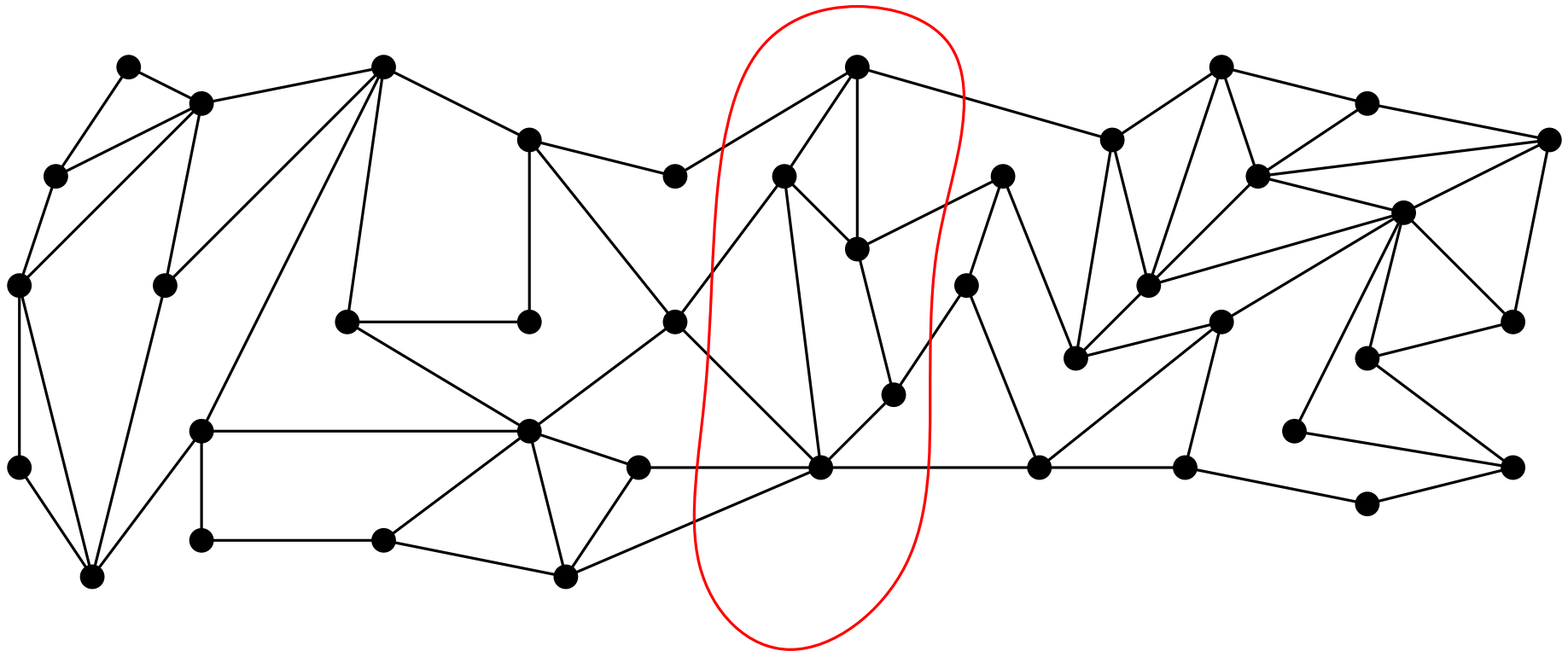
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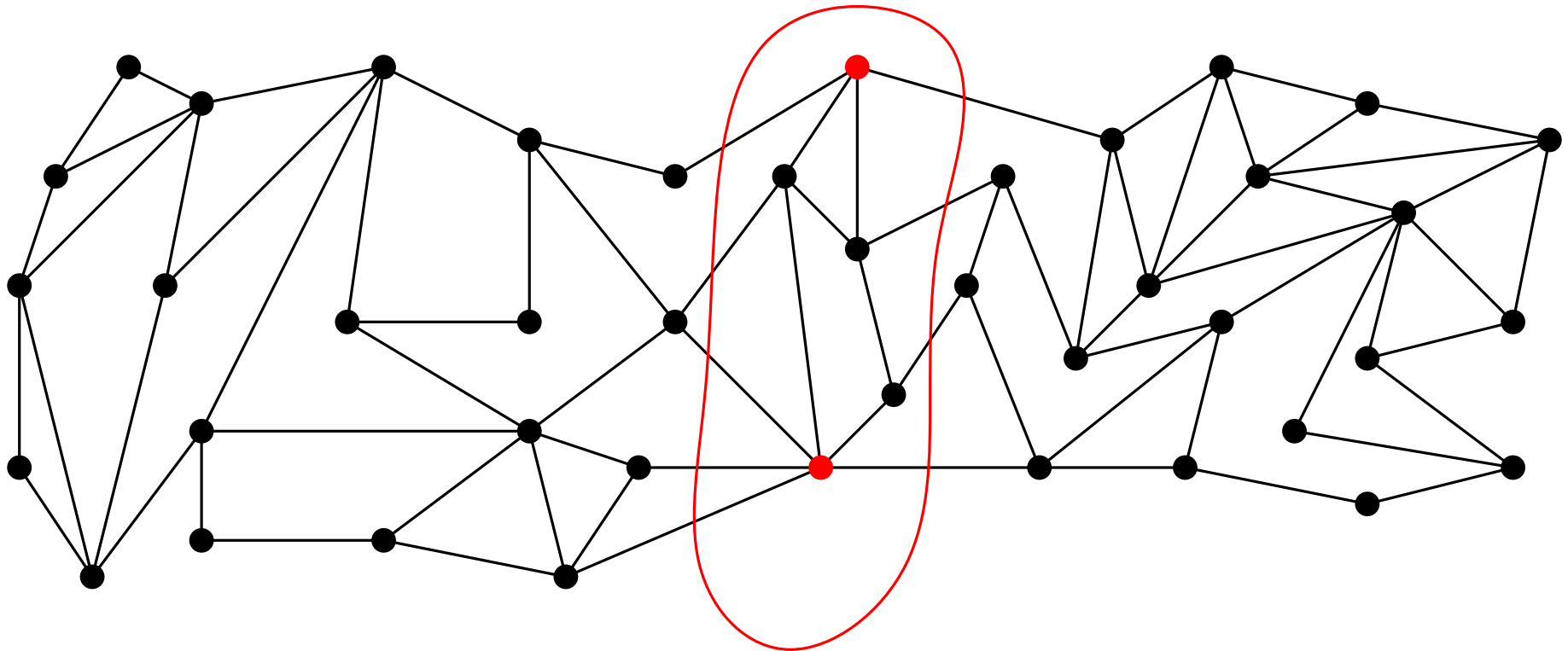
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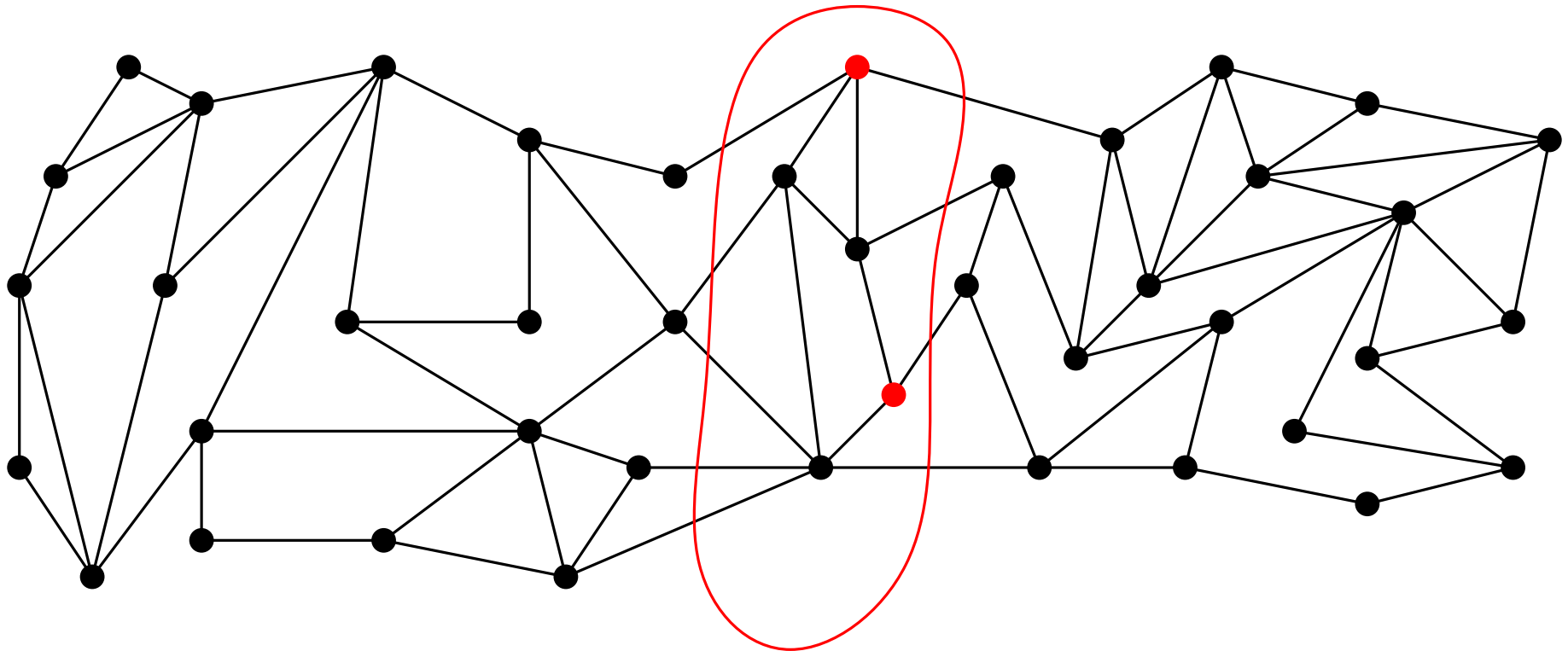
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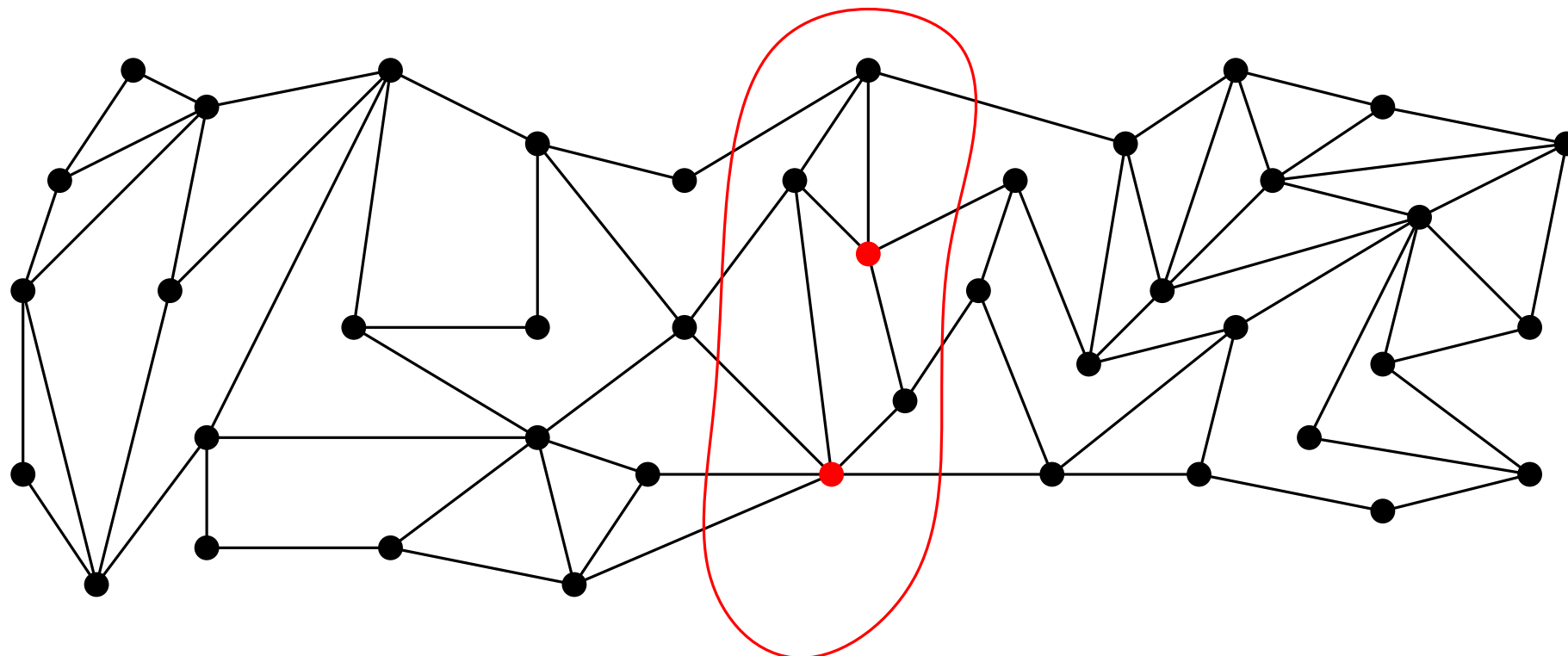
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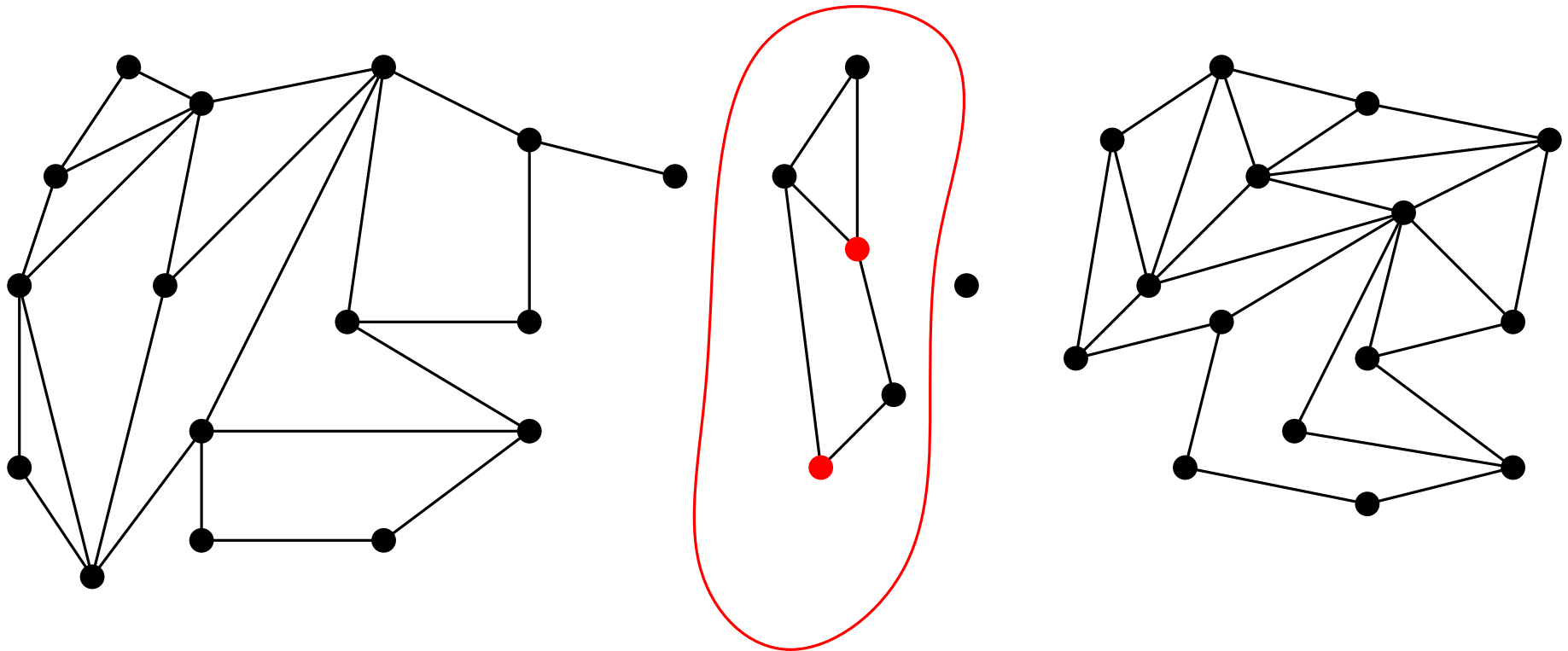
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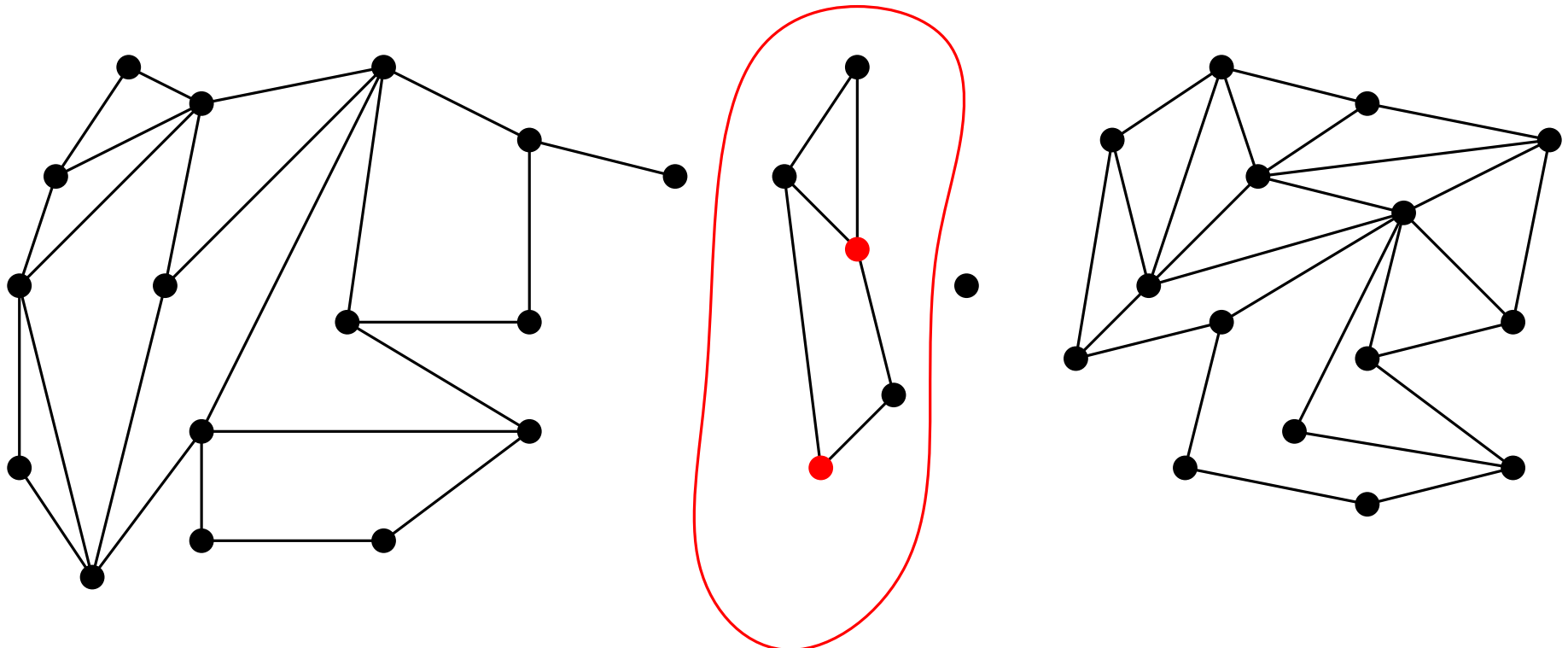
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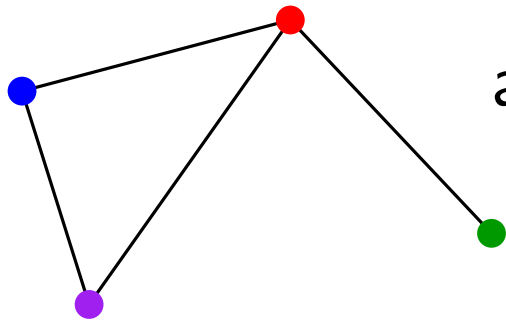
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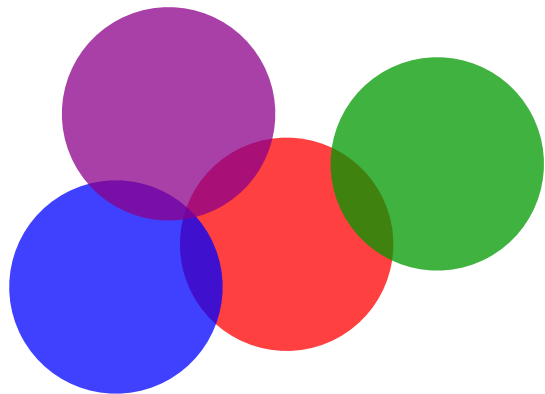
INDEPENDENT SET

- ▶ divide & conquer gives a $2^{\mathcal{O}(\sqrt{n})}$ algorithm

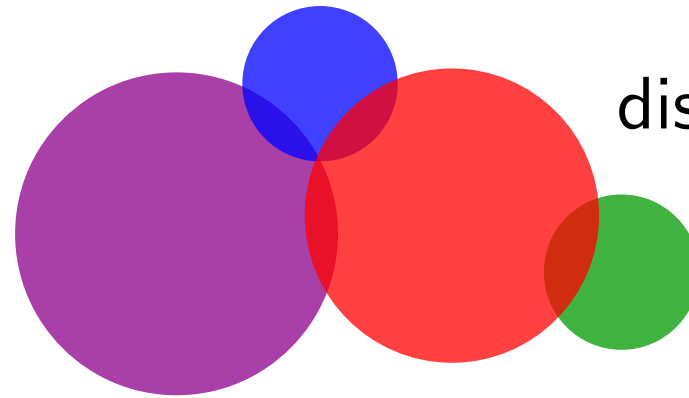
Geometric intersection graphs



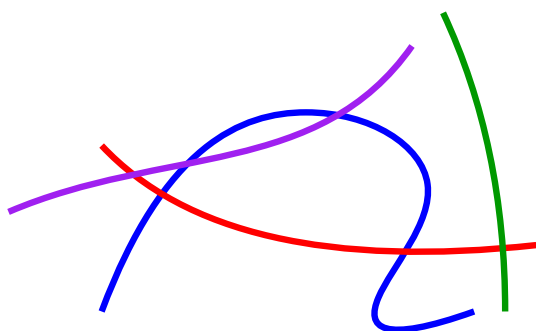
as an intersection graph of:



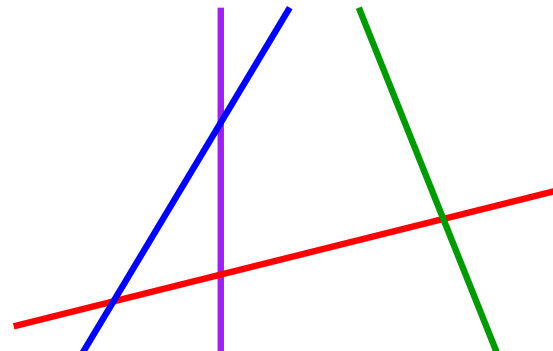
unit disks
(UDG)



disks (DG)

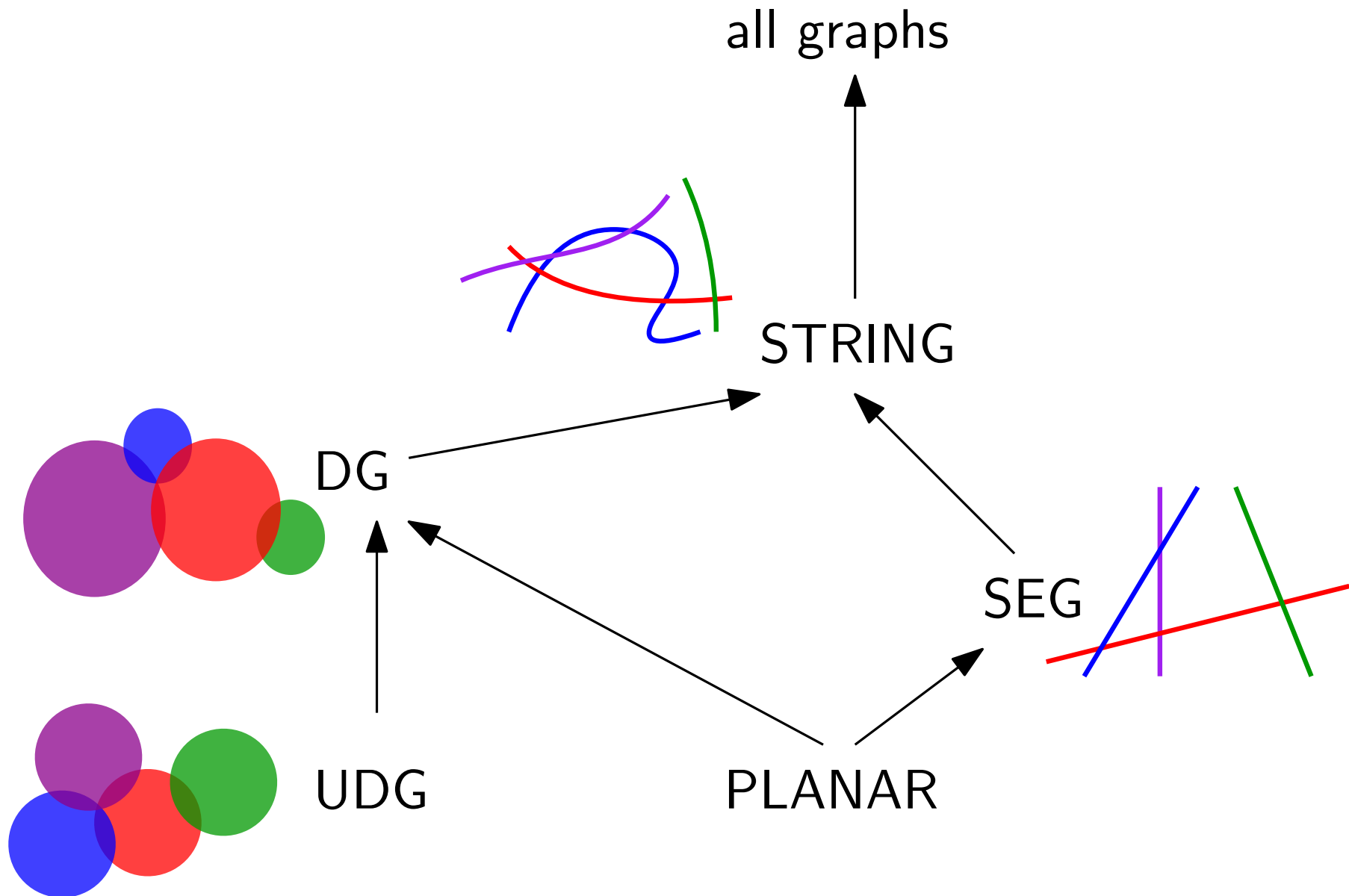


curves
(STRING)



segments
(SEG)

Relations between classes



Separator-based algorithms for disk intersection graphs

k -COLORING disk graphs

Disk separator theorem [Miller et al., 1997].

Intersection graph of disks with ply at most k has a balanced separator of size $\mathcal{O}(\sqrt{nk})$.

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k -COLORING of disk graphs

1. ply $> k \rightarrow$ a clique of size $> k \rightarrow$ return NO
2. ply $\leq k \rightarrow$ a balanced separator S of size $\mathcal{O}(\sqrt{nk})$
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Theorem: For any fixed k , k -COLORING can be solved in time $2^{\mathcal{O}(\sqrt{n})}$ for disk graphs.

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Key observation:

Yes-instances of k -COLORING do not have large cliques.

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- ▶ ... but not too much can happen on a clique

Let Q be a clique in G , $|Q| = \tau$.

- ▶ at most one vertex of Q belongs to the optimal solution
- ▶ we can branch into $\tau + 1$ instances, each of size $n - \tau$

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4. recurse using divide & conquer $(2^{\mathcal{O}(\sqrt{n\tau})})$

INDEPENDENT SET for disk graphs, ctd.

- ▶ we have two basic steps:
 - ▶ branching with complexity $2^{\tilde{O}(n/\tau)}$
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Also, still quite boring!

Optimality for segment and string graphs

INDEPENDENT SET for string graphs

String separator theorem [Matoušek, 2014, Lee, 2016].

String graphs have balanced separators of size $\mathcal{O}(\sqrt{m})$.

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1. there is a vertex v of degree at least $\tau = n^{1/3} \rightarrow$ branching
 - ▶ we either discard v , or choose it to the solution

$$F(n) \leq F(n-1) + F(n - n^{1/3})$$

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2. $m \leq n^{4/3} \rightarrow$ a balanced separator of size $\mathcal{O}(n^{2/3})$

- ▶ guess the solution on S and recurse

complexity $2^{\tilde{\mathcal{O}}(n^{2/3})}$

3-COLORING

1. there is a vertex v of degree at least $\tau = n^{1/3} \rightarrow ???$
 - ▶ guessing a color for v does not mean we can discard $N(v)$!

2. $m \leq n^{4/3} \rightarrow$ a balanced separator of size $\mathcal{O}(n^{2/3})$
 - ▶ guess the solution on S and recurse: complexity $2^{\tilde{O}(n^{2/3})}$.

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 - ▶ at least $n^{1/3}/4$ neighbors of v have the same list L
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The resulting graph might not be a string graph
→ we cannot use the separator theorem!

k -COLORING of string graphs

Theorem [Bonnet, Rz., 2018]. k -COLORING for string graphs:

1. for $k = 3$, can be solved in time $2^{\tilde{O}(n^{2/3})}$,
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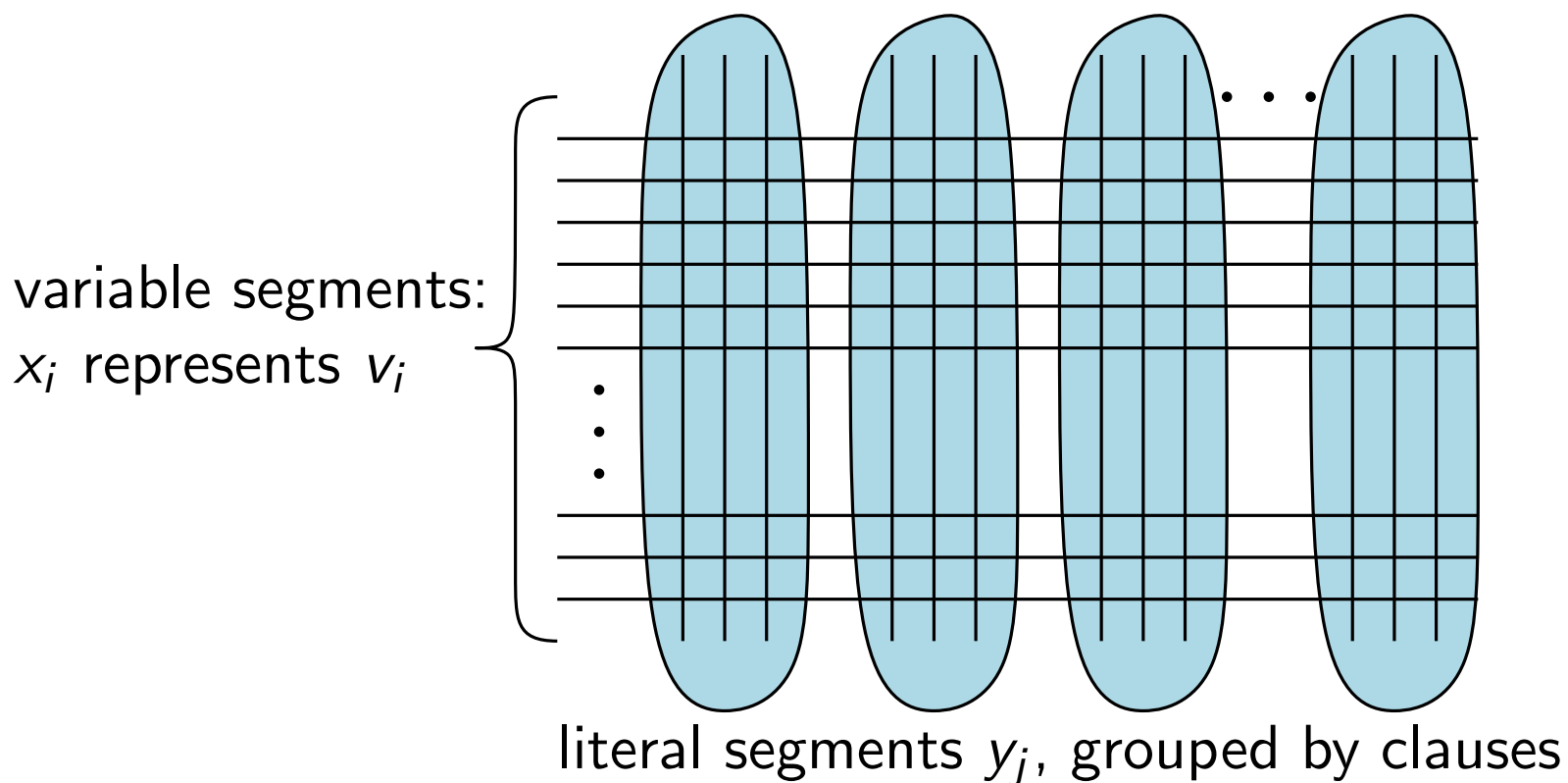
Even though G is dense, almost all its edges are meaningless!

Hardness of LIST 4-COLORING

- ▶ reduce from 3-SAT with n variables and $m = \mathcal{O}(n)$ clauses
- ▶ variables: v_1, v_2, \dots, v_n , clauses C_1, \dots, C_m
- ▶ we show hardness even for segment graphs

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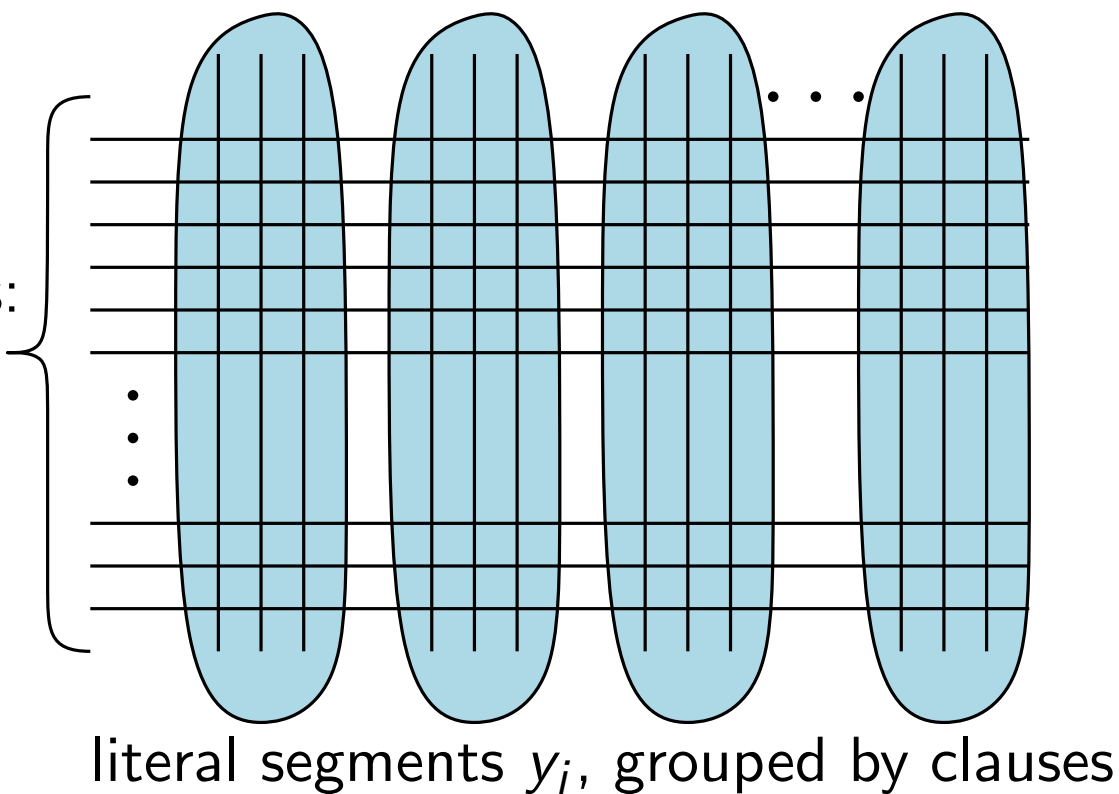
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- ▶ x_i 's have lists $\{1, 2\}$,
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variable segments:
 x_i represents v_i

Intended meaning:

1 and 3 correspond to true
2 and 4 correspond to false



Hardness of LIST 4-COLORING, ctd.

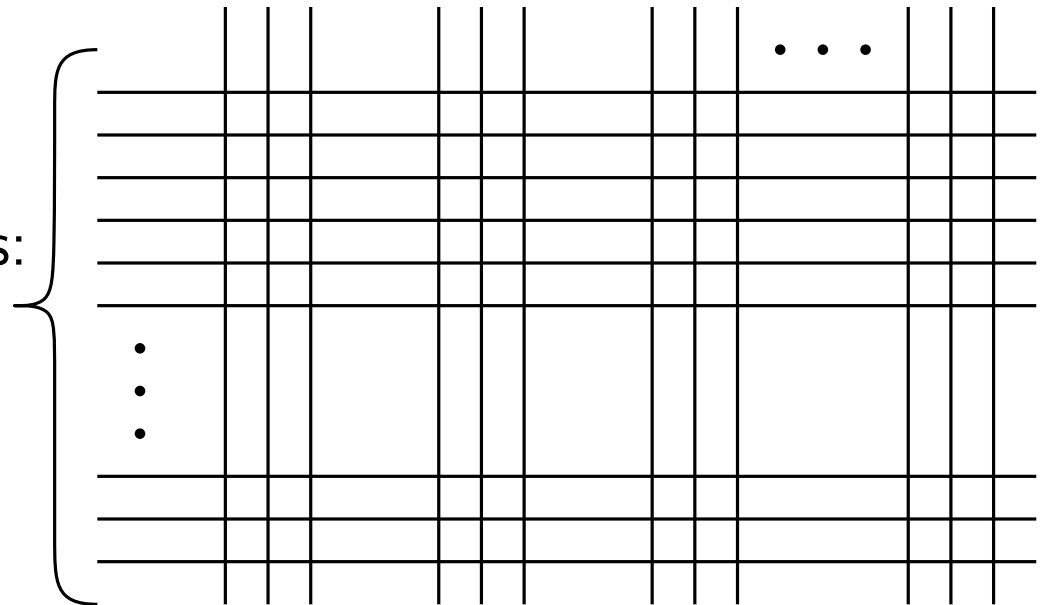
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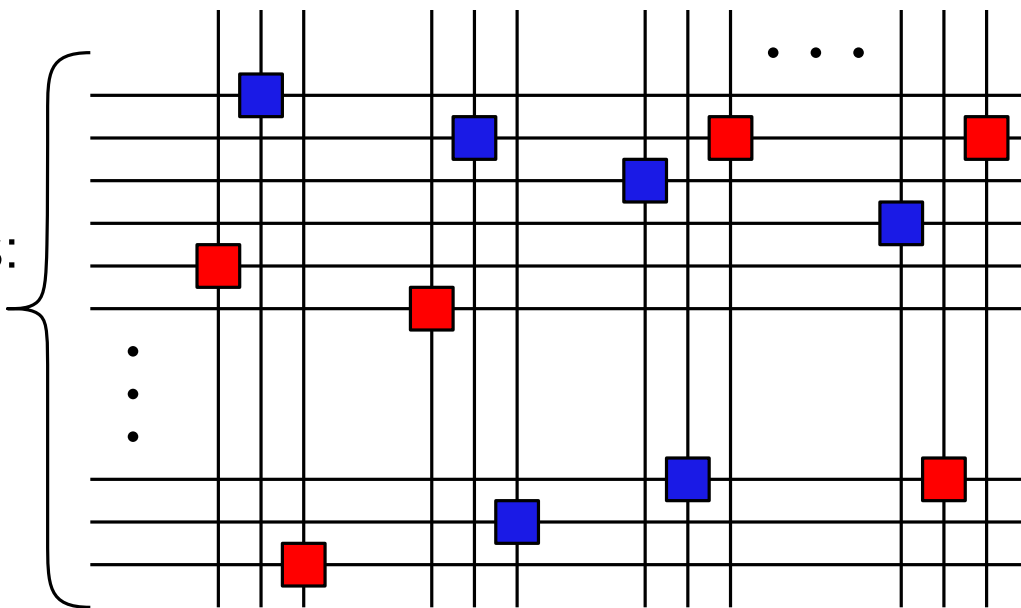
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- ▶ satisfiability

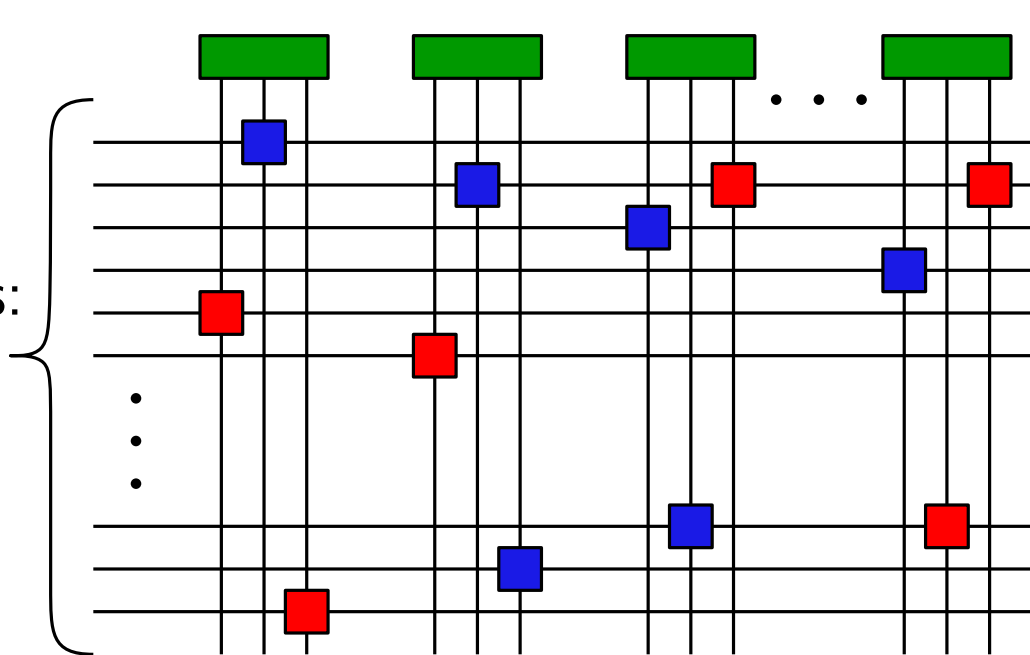
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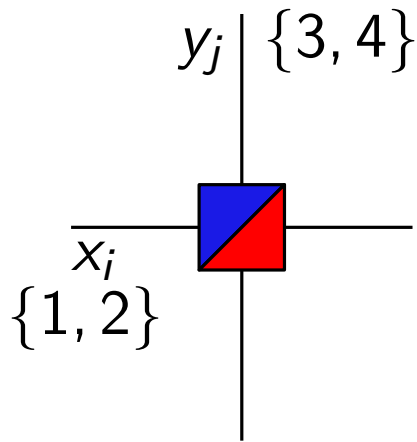
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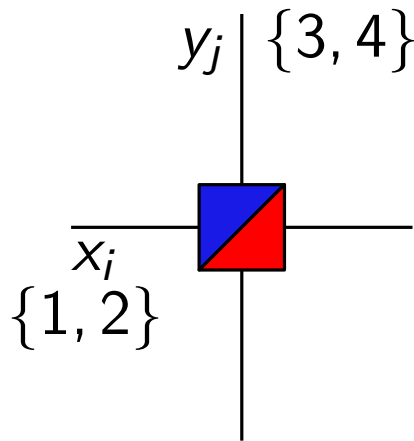
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

Consistency gadgets

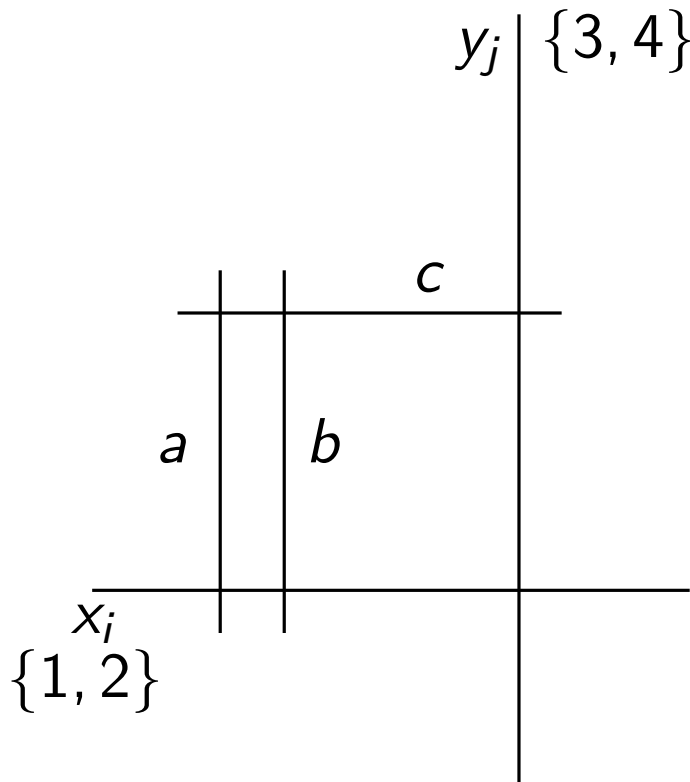




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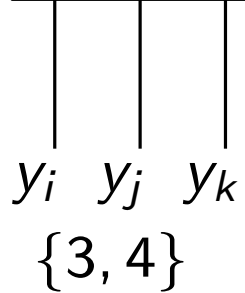
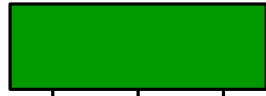


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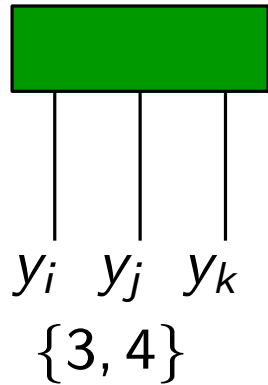
		
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<i>c</i>	3, 4	3, 4

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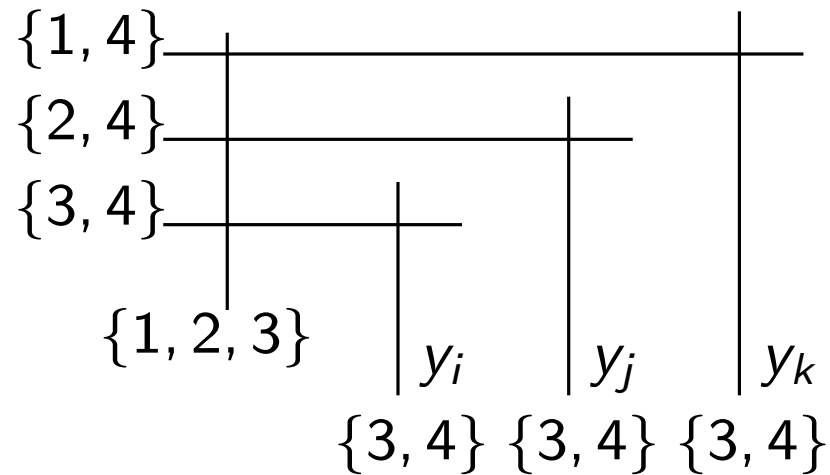


at least one of u_i, y_j, y_k must get color 3

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

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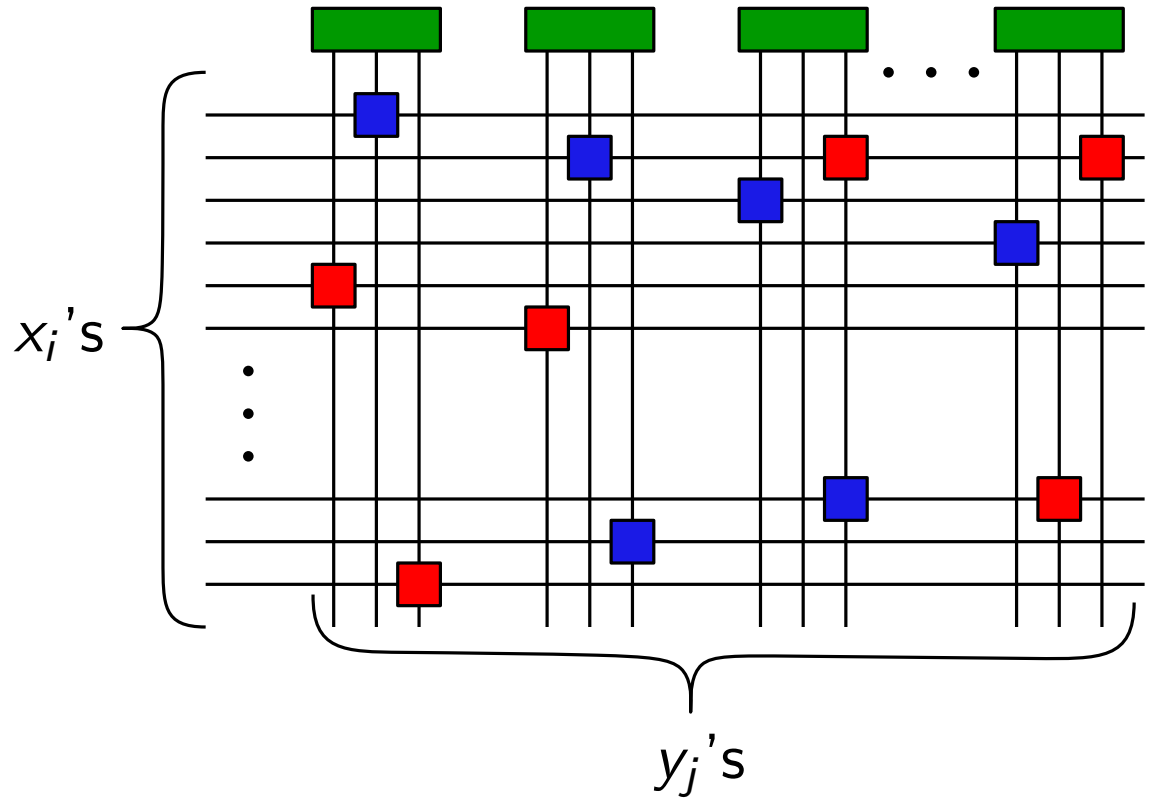


- ▶ note segments with three-element lists (if all lists have at most two elements, then the problem is in P)

Wrap-up



- ▶ we reduced from 3-SAT with n variables and $m = \mathcal{O}(n)$ clauses
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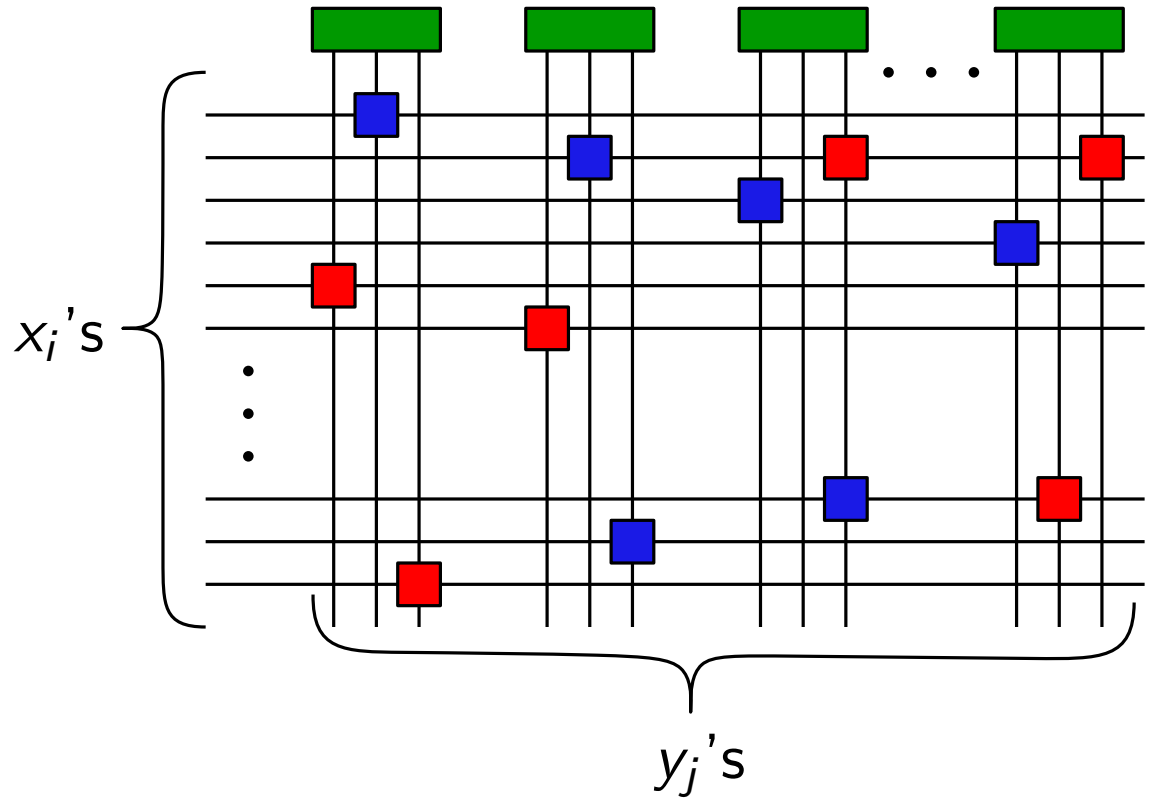
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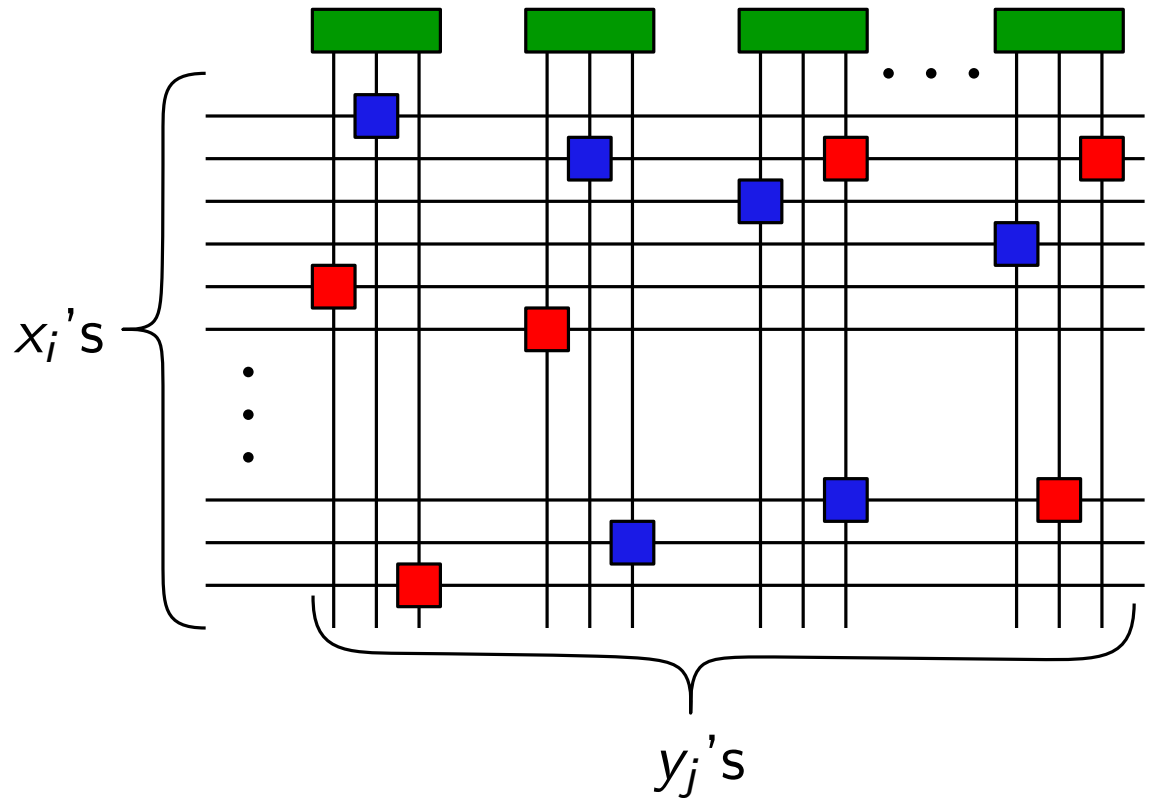
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- ▶ solving LIST 4-COLORING in segment graphs with N vertices in time $2^{\mathcal{O}(N)}$
 - solving 3-SAT in time $2^{\mathcal{O}(n)}$
 - ETH fails

FEEDBACK VERTEX SET in string graphs

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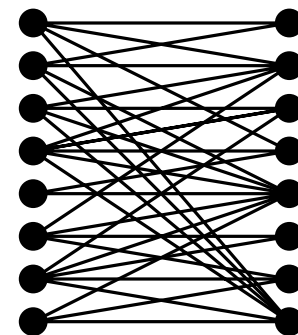
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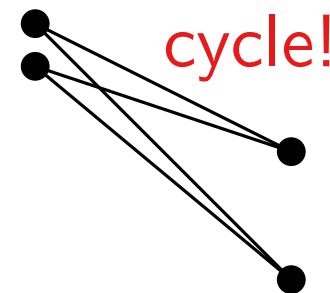
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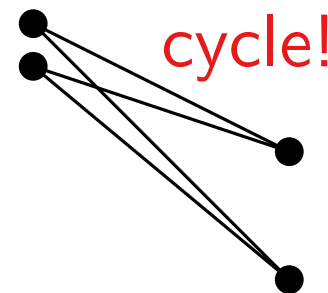
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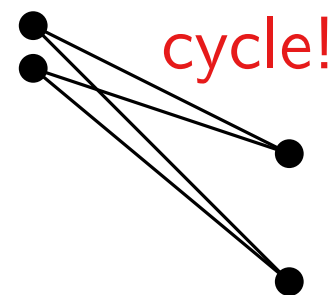
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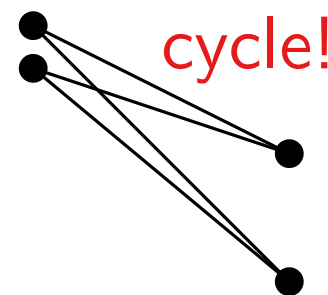
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▶ But no $2^{o(n)}$ algorithm for ODD CYCLE TRANSVERSAL

A detour: the need of representation
and robust algorithms

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$\exists\mathbb{R}$ – class of problems
polynomially equivalent to ETR.

ETR: decide if a formula is **true**

$$\exists x_1 \exists x_2 \dots \exists x_n \phi(x_1, \dots, x_n)$$

x_i 's are **reals**,

ϕ is quantifier-free and uses

$\wedge, \vee, \neg, =, \rightarrow, >, +, -, \times$ (in \mathbb{R})

Recognizing segment graphs

- ▶ What about segment graphs? Any non-trivial witness?

Theorem [Schaefer, Štefankovič, '17].

Recognizing segment graphs is in $\exists\mathbb{R}$ -complete.

NP = class of problems
polynomially equivalent to SAT.

SAT: decide if a formula is **true**

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- ▶ a strong indication that the problem is not in NP!
- ▶ similar for unit disk graphs [Kang, Müller, '12]

What about our algorithms?

INDEPENDENT SET in disk graphs

1. $\text{ply} > n^{1/3} \rightarrow$ a clique of size $> n^{1/3}$, branch
2. $\text{ply} \leq n^{1/3} \rightarrow$ a balanced separator S of size $\mathcal{O}(n^{2/3})$
3. guess the solution on S
4. recurse using divide & conquer

Total running time: $2^{\tilde{\mathcal{O}}(n^{2/3})}$.

- ▶ where do we need a representation?

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What about our algorithms?

INDEPENDENT SET in disk graphs

1. if we find a clique of size $> n^{1/3}$, branch
2. otherwise, find a balanced separator S of size $\mathcal{O}(n^{2/3})$
3. guess the solution on S
4. recurse using divide & conquer

Total running time: $2^{\tilde{\mathcal{O}}(n^{2/3})} + 2^{\tilde{\mathcal{O}}(n^{2/3})} = 2^{\tilde{\mathcal{O}}(n^{2/3})}$.

- ▶ where do we need a representation?
- ▶ enumerating all possibilities takes time $n^{n^{2/3}} = 2^{\tilde{\mathcal{O}}(n^{2/3})}$
- ▶ we do not really need a representation!

Robust algorithms

- ▶ An algorithm is **robust**, if it either
 - ▶ computes the correct solution, or
 - ▶ correctly concludes that the input does not belong to the right class (here: disk graphs)
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- ▶ disk graphs $\subseteq \mathcal{X}$
- ▶ on the other hand, our hardness results hold even if a geometric representation is given

When large cliques do not help

CLIQUE in disk graphs

- ▶ CLIQUE is polynomially solvable in UDG [Clark et al., 1990]
- ▶ the complexity for DG is open
- ▶ the existence of a large clique does not make the problem any easier!

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- ▶ the complexity for DG is open
- ▶ the existence of a large clique does not make the problem any easier!
- ▶ we need to make our hands dirty and look at the properties of geometric representations
- ▶ by some epsilon-perturbation we can assume that no three centers are aligned

Notation: vertex v_i is represented by a disk with the center c_i

C_4 's in disk graphs

Simple observation.

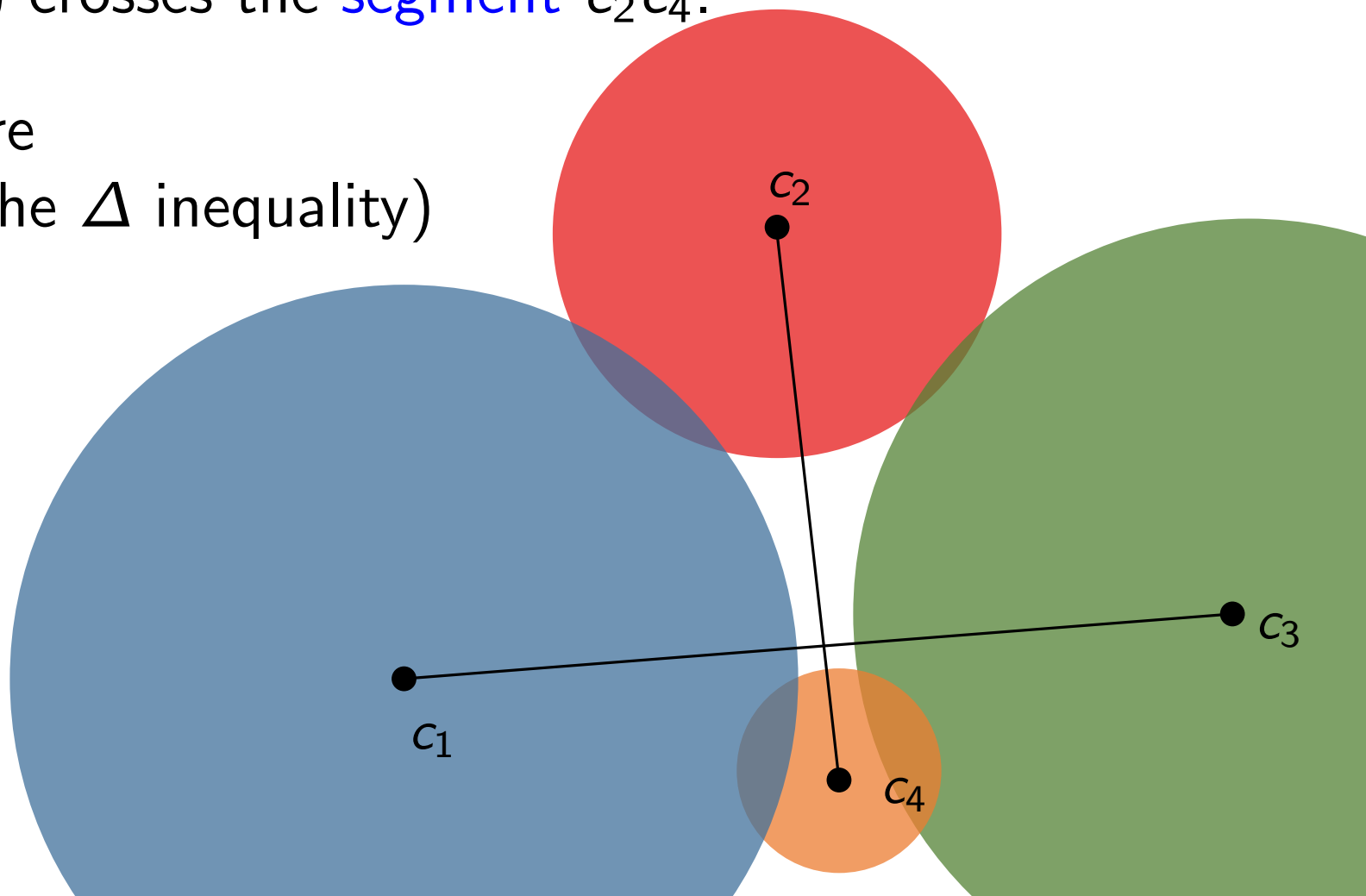
In any disk representation of C_4 with vertices v_1, v_2, v_3, v_4 :
the line $\ell(c_2c_4)$ crosses the segment c_1c_3 , or
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Proof by picture
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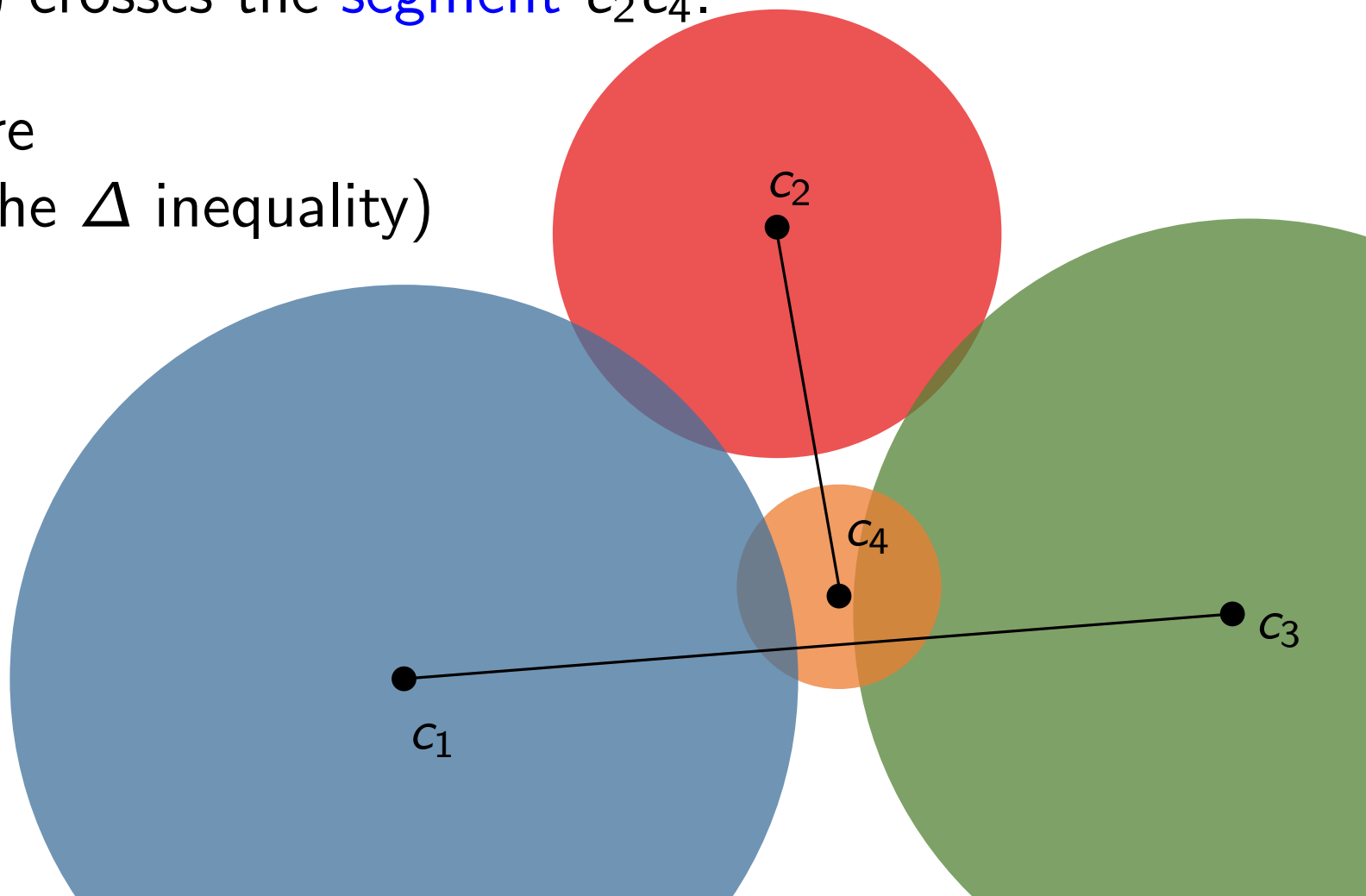


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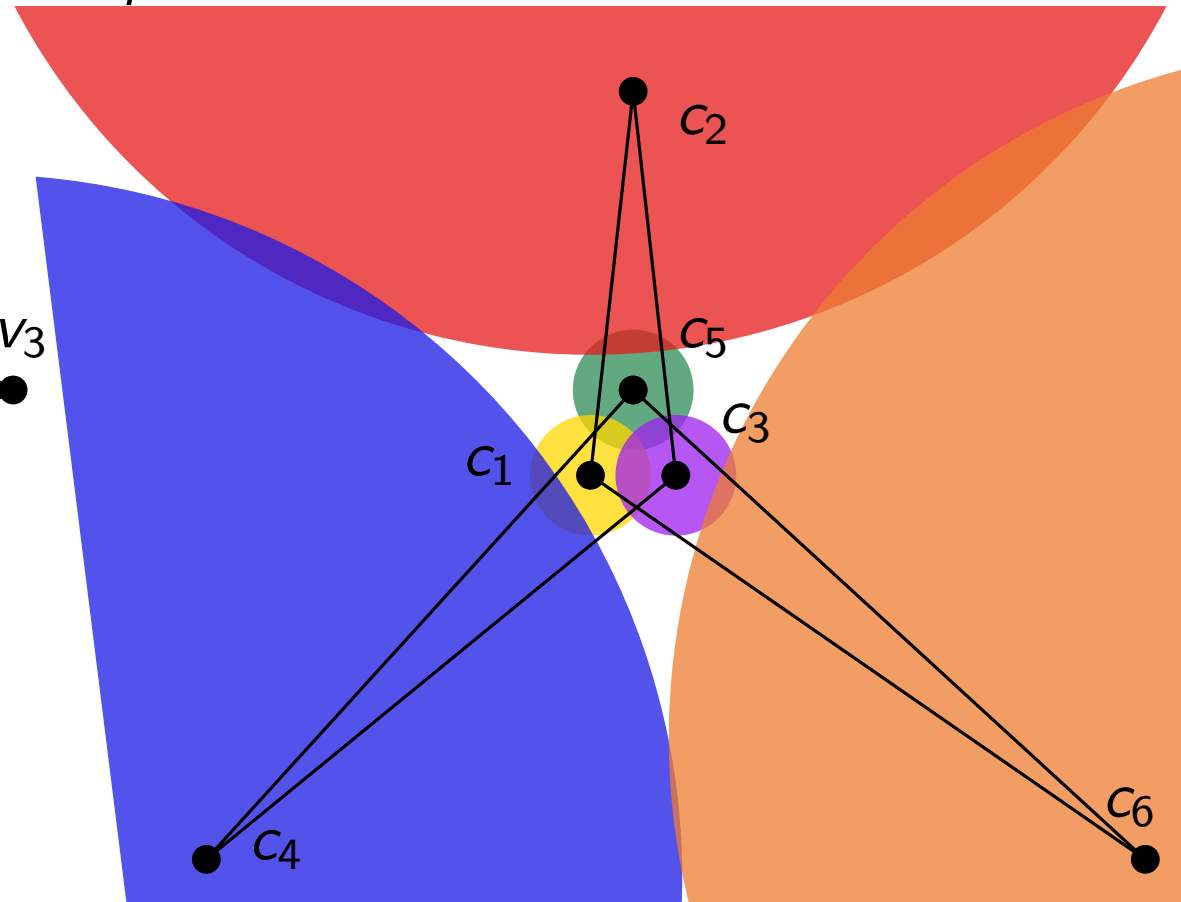
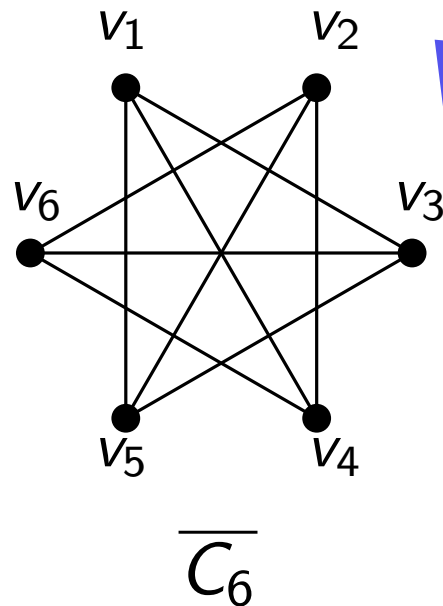
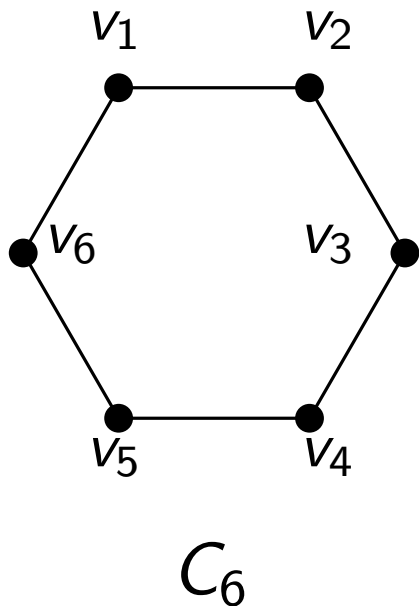
Non-disk graphs

Observation [Bonnet, Giannopoulos, Kim, Rz. Sikora, 2018].

For odd p, q , the graph $G = \overline{C_p + C_q}$ is not a disk graph.

Proof by contradiction.

- ▶ suppose there is a representation
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Proof by contradiction.

- ▶ suppose there is a representation
- ▶ let S_1, \dots, S_p and S'_1, \dots, S'_q be segments of the co-cycles
- ▶ every S_i and every S'_j correspond to $2K_2$ in \overline{G}
 - their endpoints induce a C_4 in G
 - $\ell(S_i)$ crosses S_j or $\ell(S_j)$ crosses S_i

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$$\sum_{i=1}^p (a_i + b_i - c_i) = \text{number of pairs } i, j \text{ satisfying } (\star) = pq$$

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- ▶ $\sum_{i=1}^p b_i = \sum_{i=j}^q a'_j$: also **even**
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- ▶ $c_i = \#$ of intersection points of two closed curves: **even**
- ▶ $\sum_{i=1}^p (a_i + b_i - c_i) = pq$ is **even** \rightarrow contradiction □

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INDEPENDENT SET in a co-disk graph:

1. vertex of degree at least $n^{1/3} \rightarrow$ branching
2. no odd cycle of length $< n^{1/3} \rightarrow$
there is $|X| = \mathcal{O}(n^{2/3})$ and $G - X$ bipartite
3. odd C of length $\leq n^{1/3}$ and $\Delta \leq n^{1/3} \rightarrow$
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Theorem [BGKRzS '18].

CLIQUE in disk graphs can be solved in time $2^{\tilde{O}(n^{2/3})}$.

Open problem: MAX CUT in disk graphs

- ▶ partition vertices into two sets, to maximize the number of crossing edges
- ▶ NP-hard on unit disk graphs, reduction is quadratic \rightarrow no $2^{o(\sqrt{n})}$ algorithm
- ▶ is there a subexponential algorithm?

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- ▶ complexity even unclear for (unit) interval graphs

Episode 2: parameterized algorithms

Geometric separators

k -INDEPENDENT SET in unit disk graphs

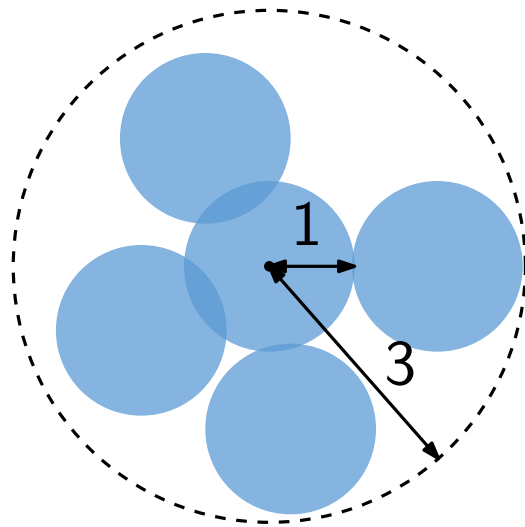
- ▶ is there an independent set of size at least k ?
- ▶ are there k disjoint disks?

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if total area is $< k \cdot \pi$, then NO

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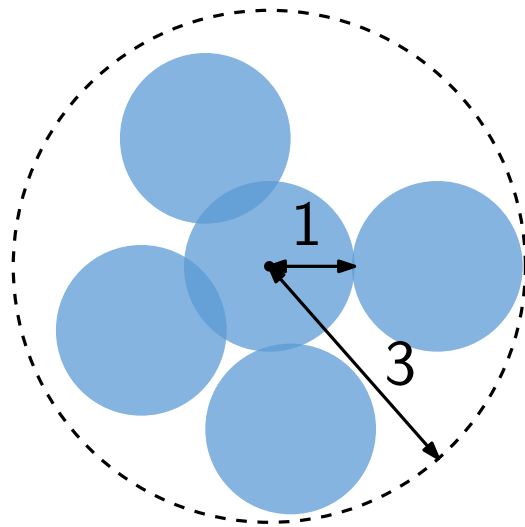
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if total area is $\geq k \cdot 9 \cdot \pi$, then YES



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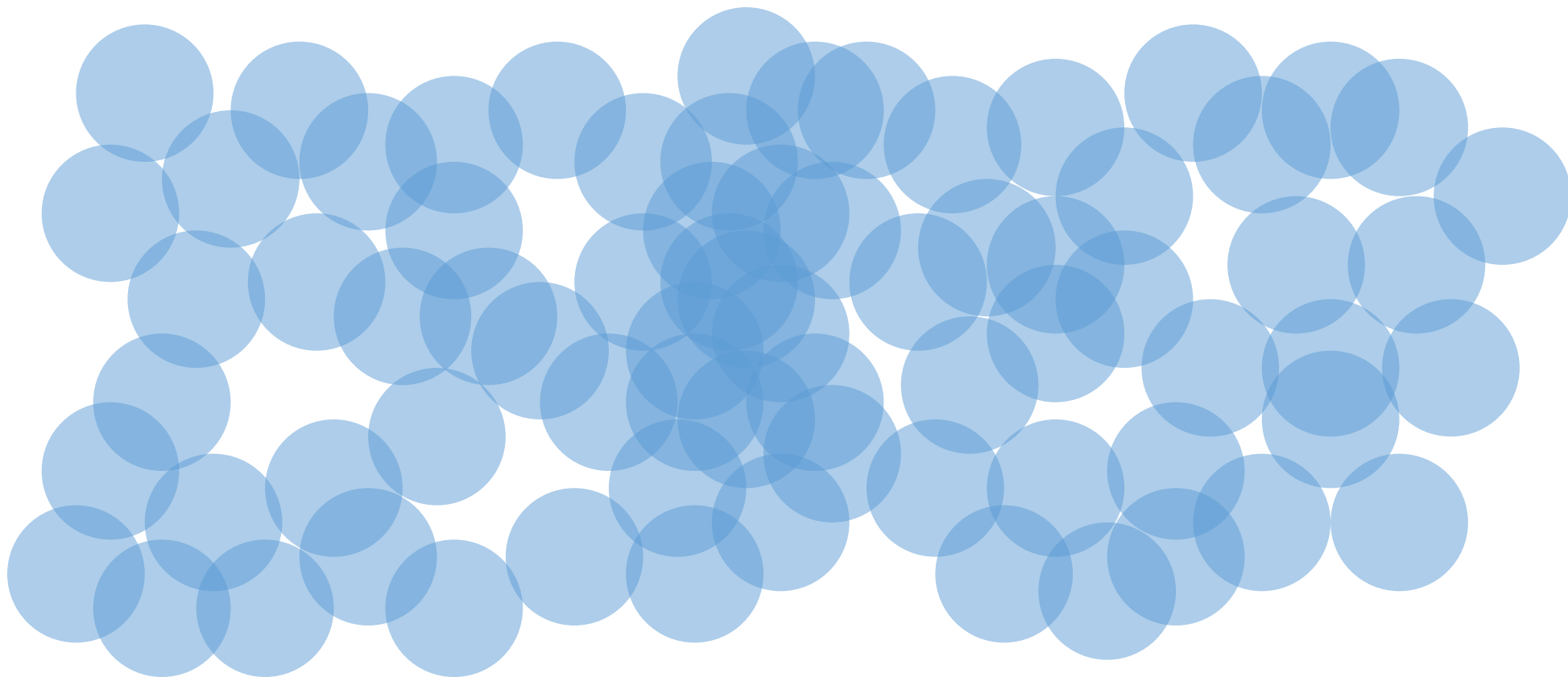
- ▶ assume that $\pi \cdot k \leq \text{total area} \leq 9\pi \cdot k$

Geometric separator theorem for unit disks

Geometric separator theorem [Alber, Fiala, '04].

Given a collection of unit disks with total area A , there exists a set S of disks, such that:

- ▶ total area of disks in S is $\mathcal{O}(\sqrt{A})$,
- ▶ removing S gives connected parts of roughly equal area.

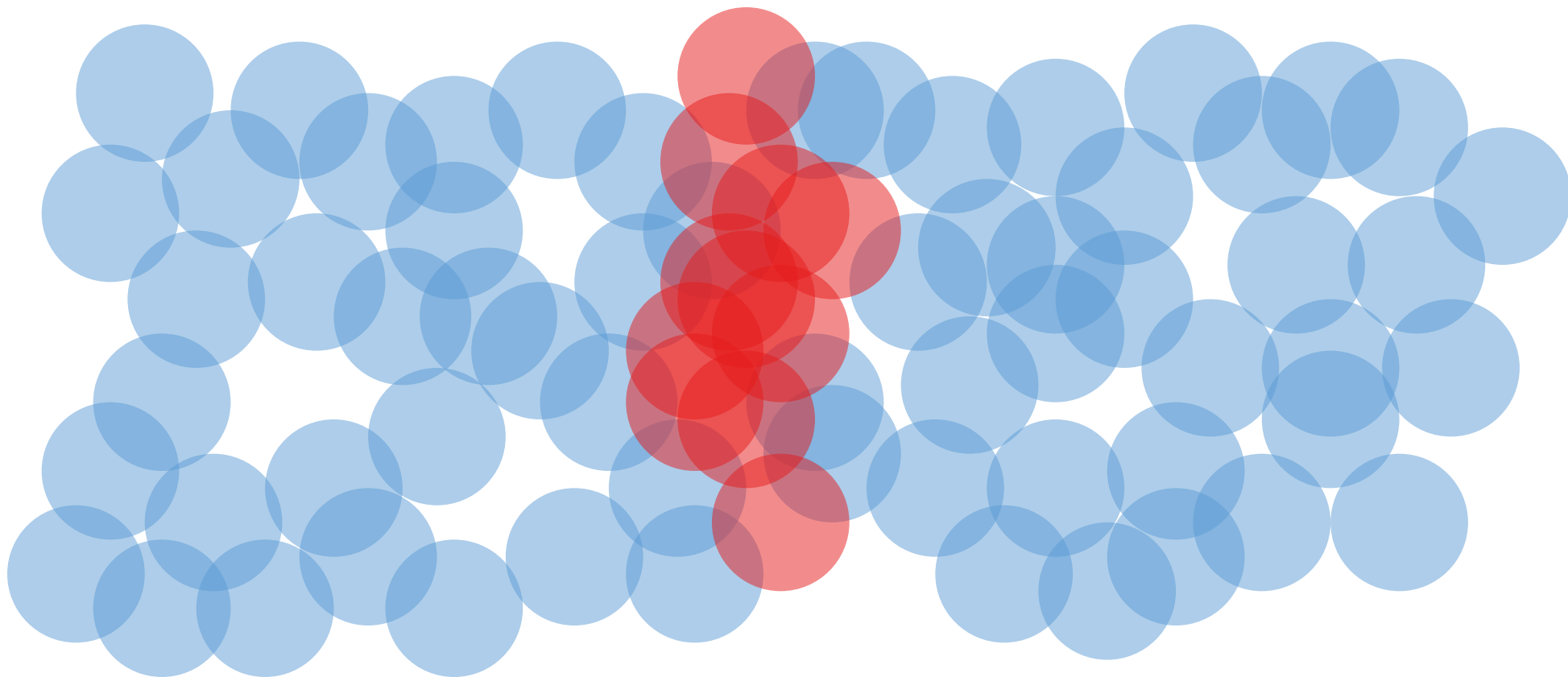


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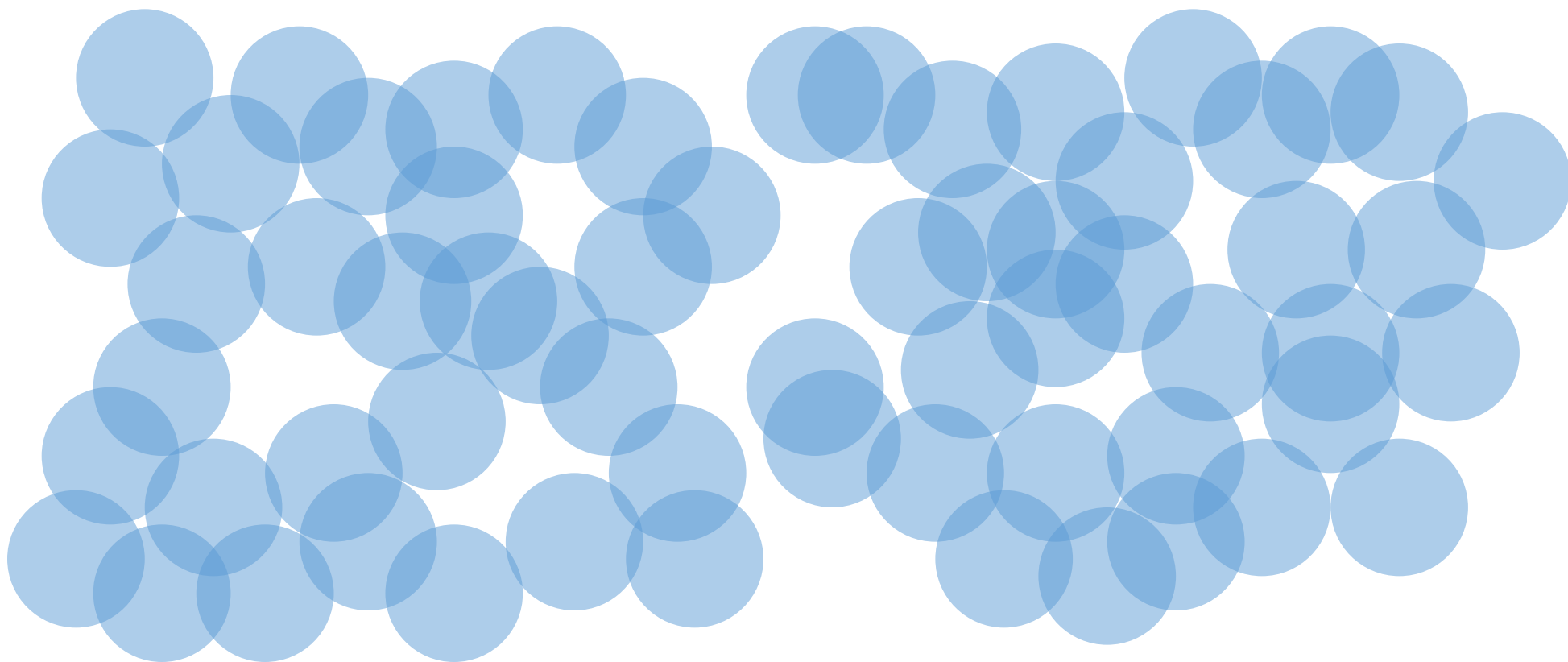


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Divide & conquer using geometric separators

Algorithm [Alber, Fiala, '04].

1. $A =$ total area
2. if $A < \pi \cdot k$, return NO
3. if $A > 9\pi \cdot k$, return YES
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- what is the largest possible independent set in S ?

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- ▶ what is the largest possible independent set in S ?
$$\text{area}(S)/\pi = \mathcal{O}(\sqrt{k})$$
 - ▶ what is the maximum number of independent sets in S ?
$$\sum_{i=0}^{\mathcal{O}(\sqrt{k})} \binom{n}{i} = n^{\mathcal{O}(\sqrt{k})}$$

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 - ▶ overall complexity is $n^{\mathcal{O}(\sqrt{k})}$

Evaluation

Strengths

- ▶ simple
- ▶ parameterized
- ▶ faster than what we had in the classical setting:
$$\sum_{k=1}^n n^{O(\sqrt{k})} = 2^{\tilde{O}(\sqrt{n})},$$
 compared to $2^{\tilde{O}(n^{2/3})}$
- ▶ optimal (under ETH)
- ▶ works also for disks and other shapes with bounded area

Weaknesses

- ▶ doesn't work for general disk graphs, not to say about segment/string graphs
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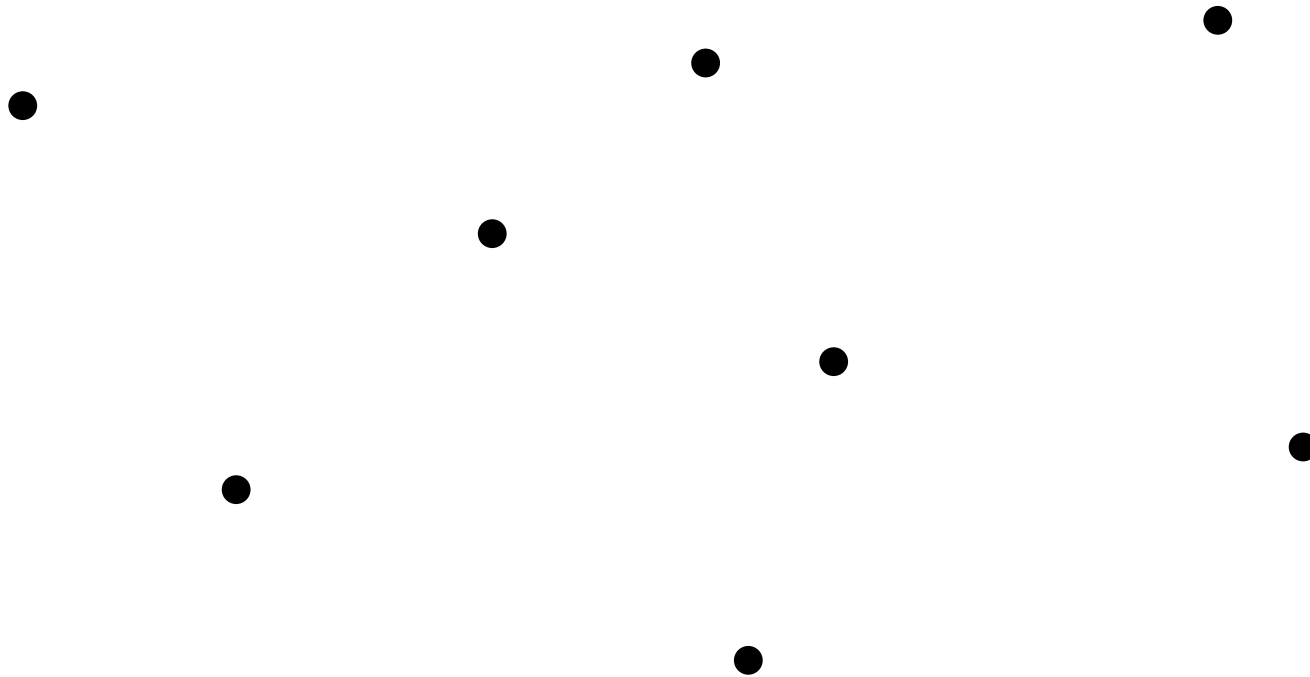
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- ▶ in the remainder of this part we will learn how to address the first weakness, using a different approach

Voronoi-diagram approach

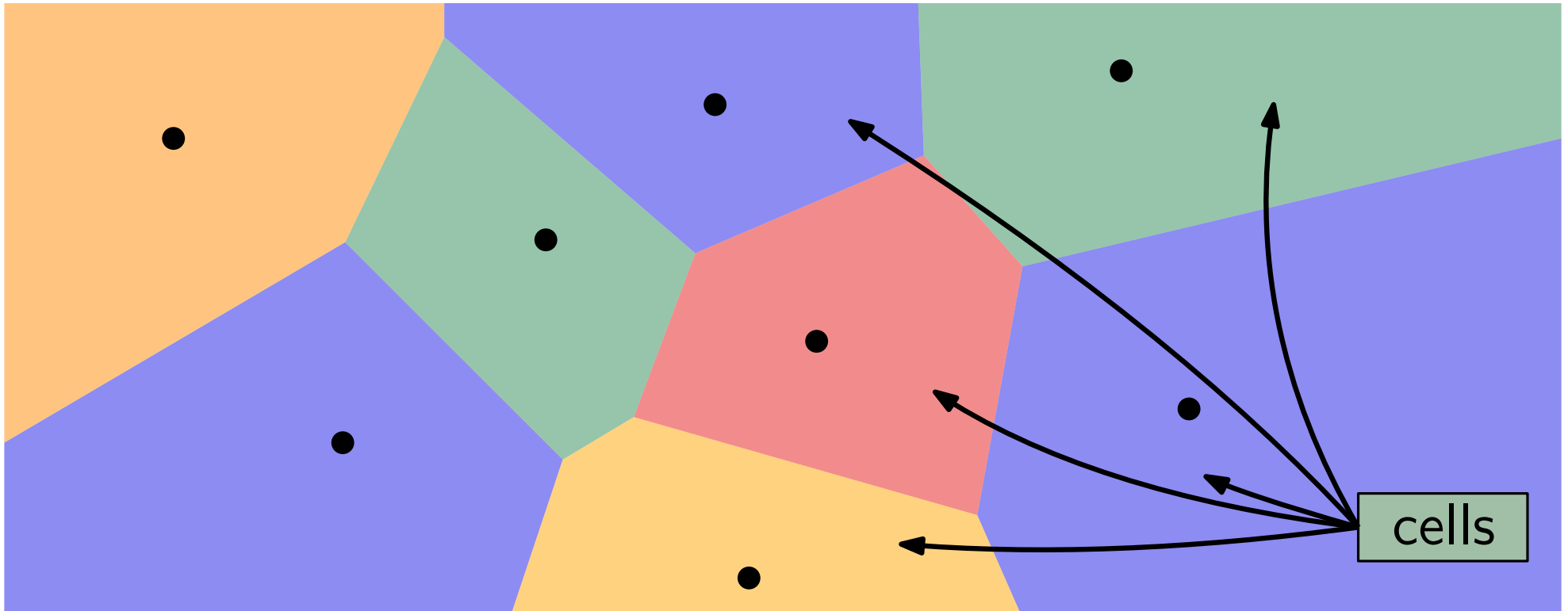
Voronoi diagrams

- ▶ we are given n points in the plane (**objects**)
- ▶ each point of the plane is assigned to the **closest** object



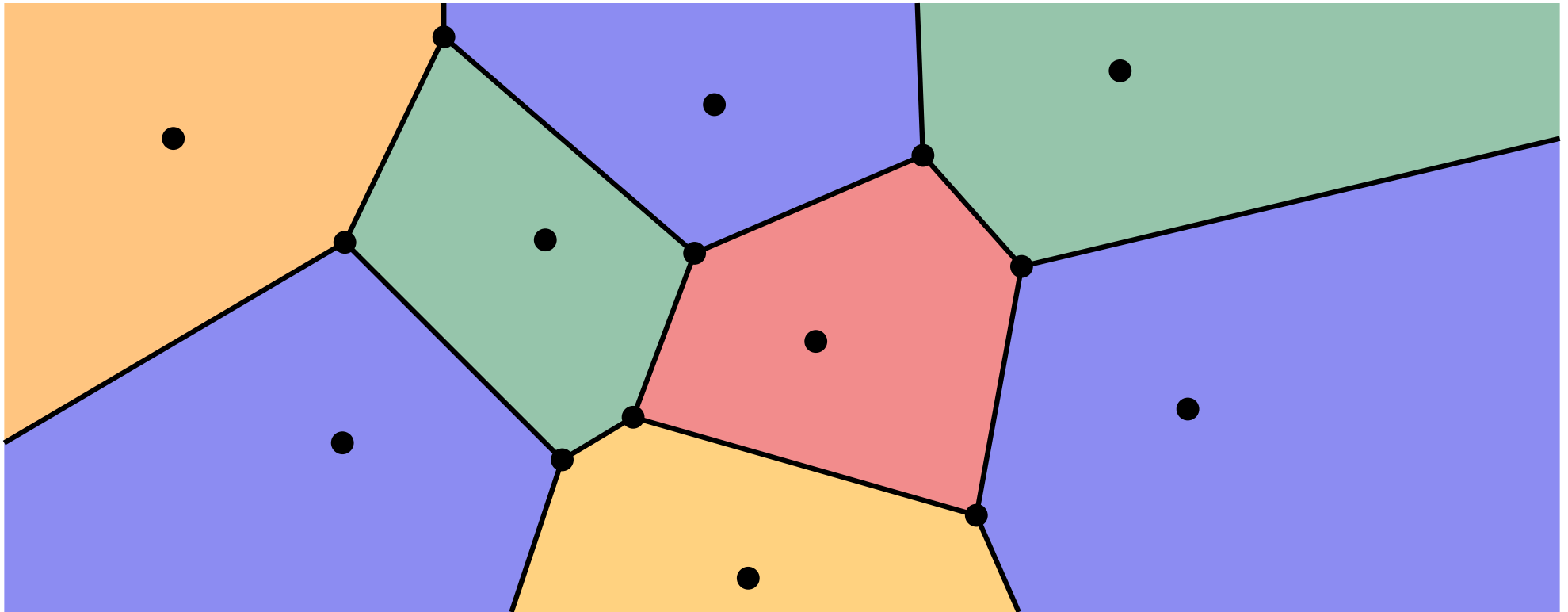
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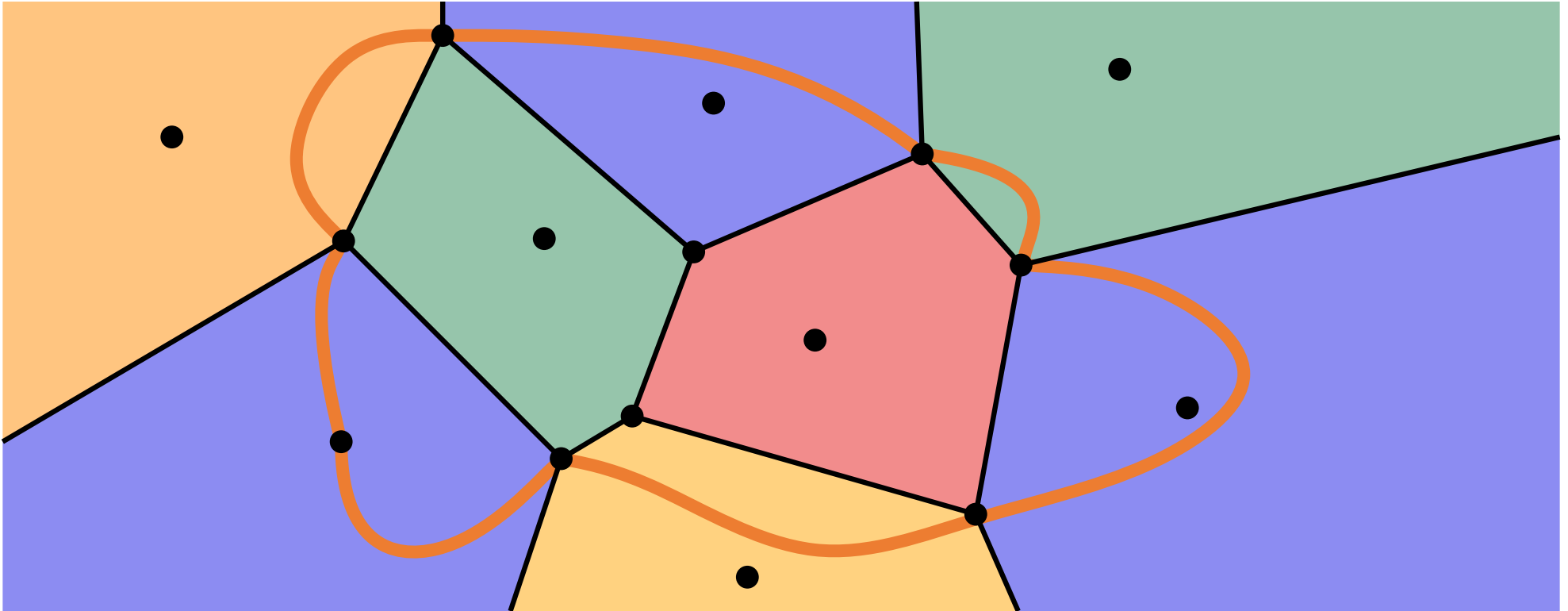
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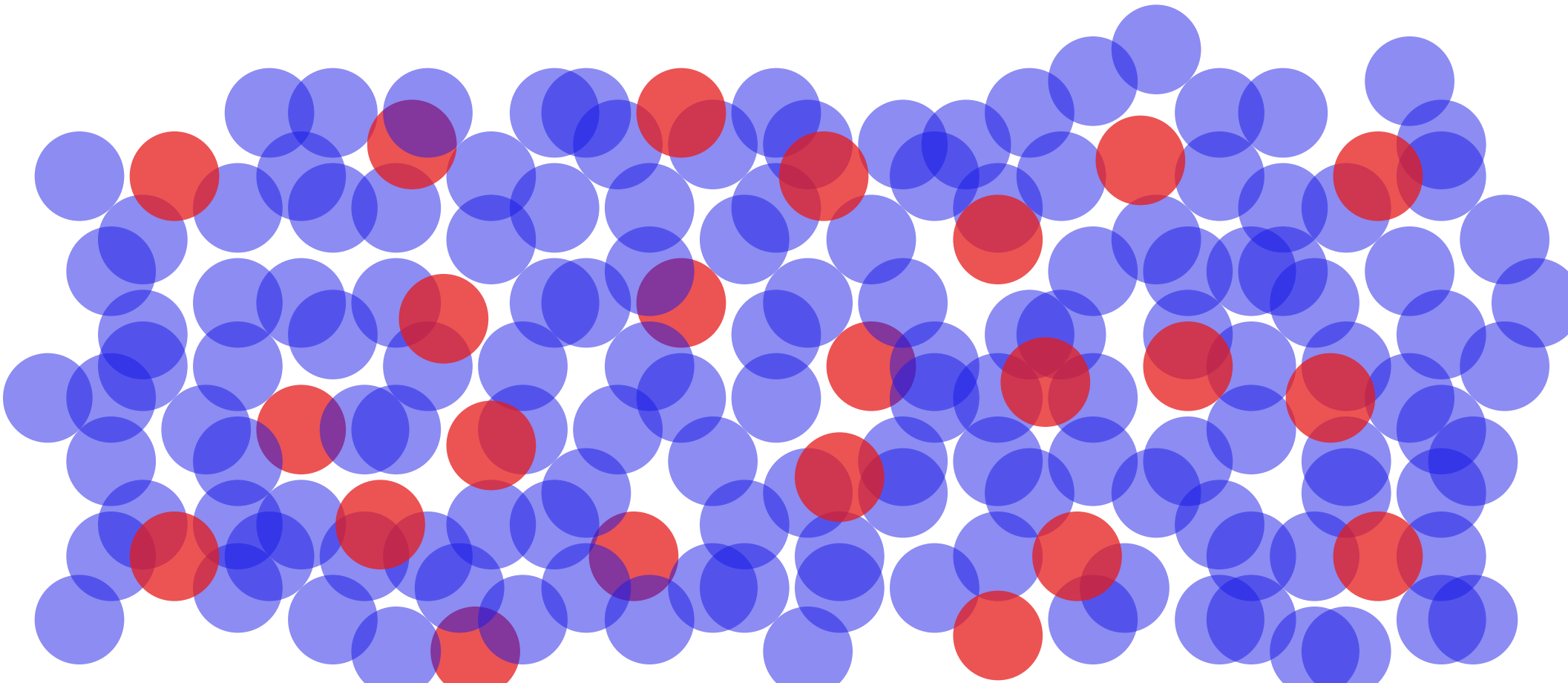


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Theorem [Marx, Pilipczuk '15]. Each graph like this has a balanced **noose** separator of size $\mathcal{O}(\sqrt{n})$.

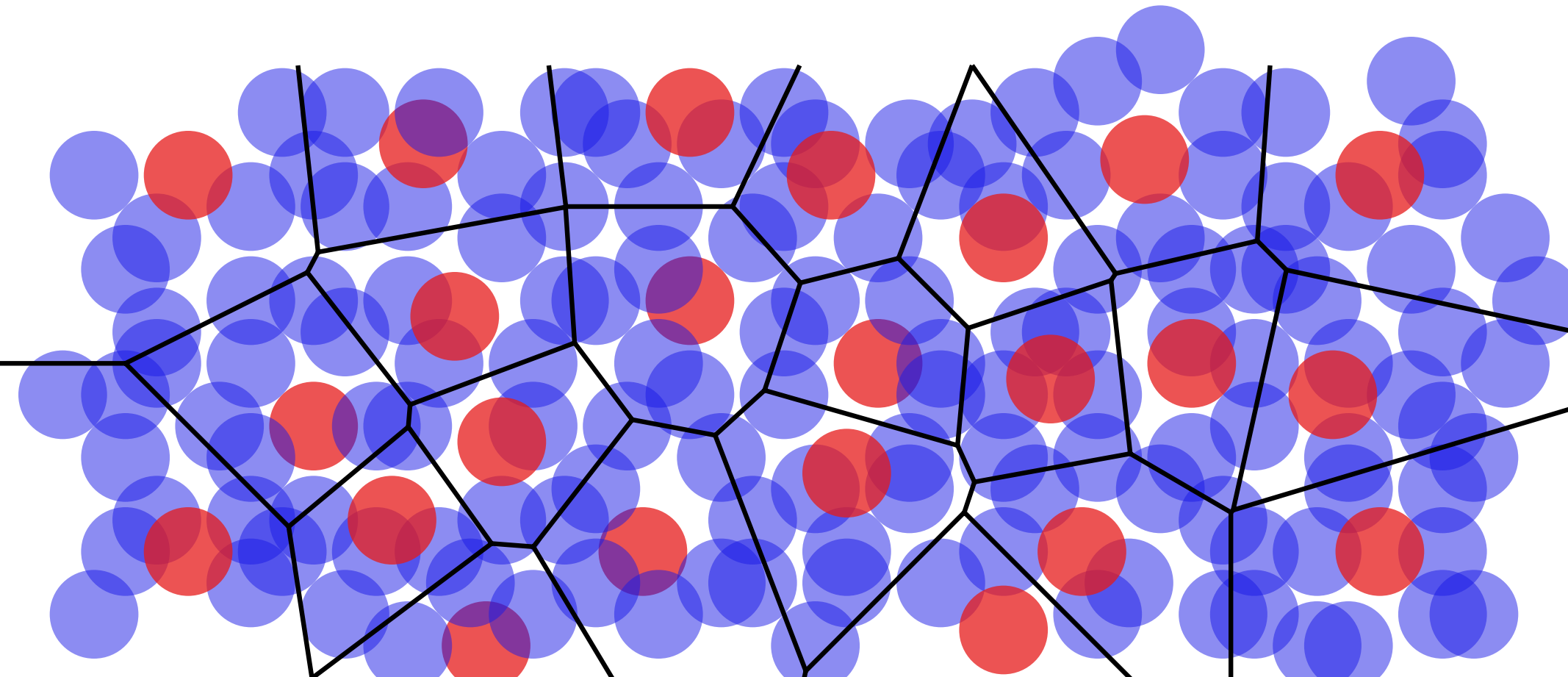
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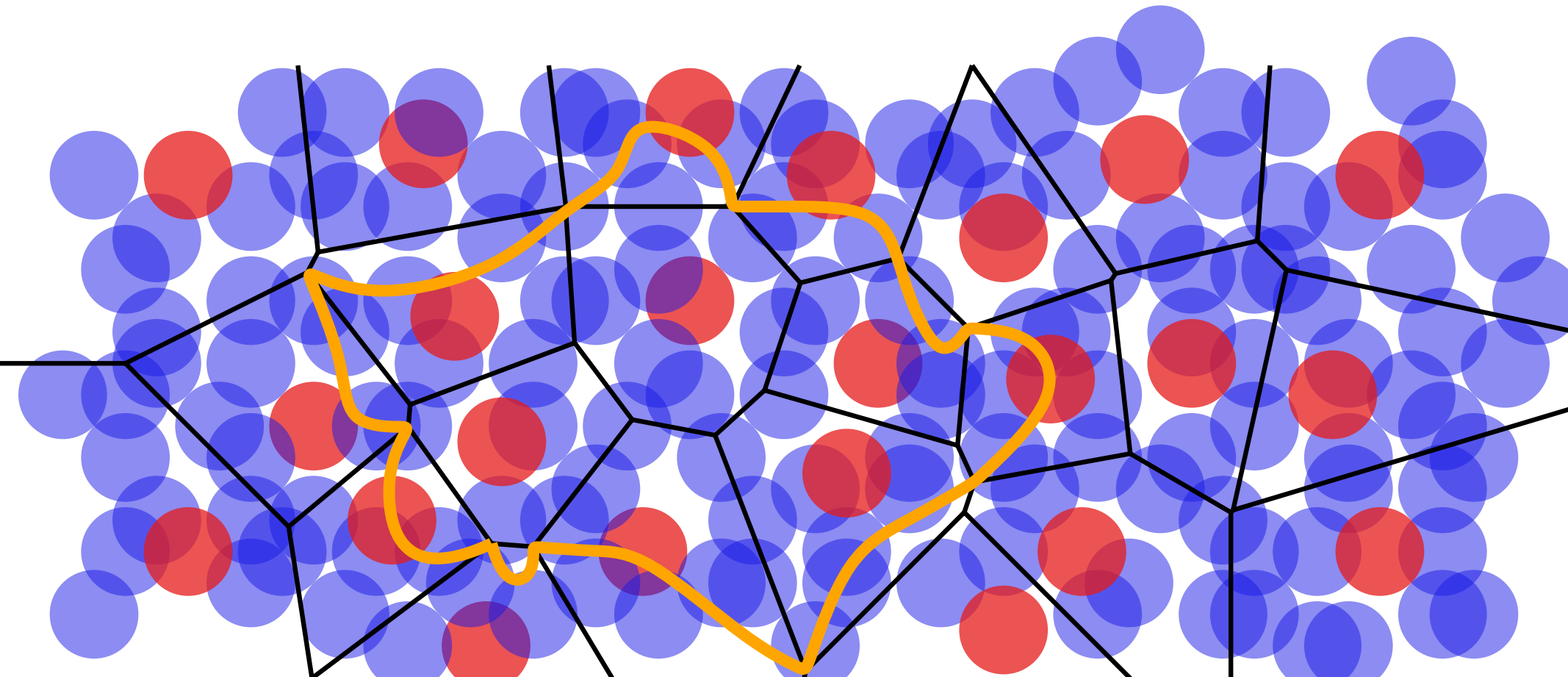
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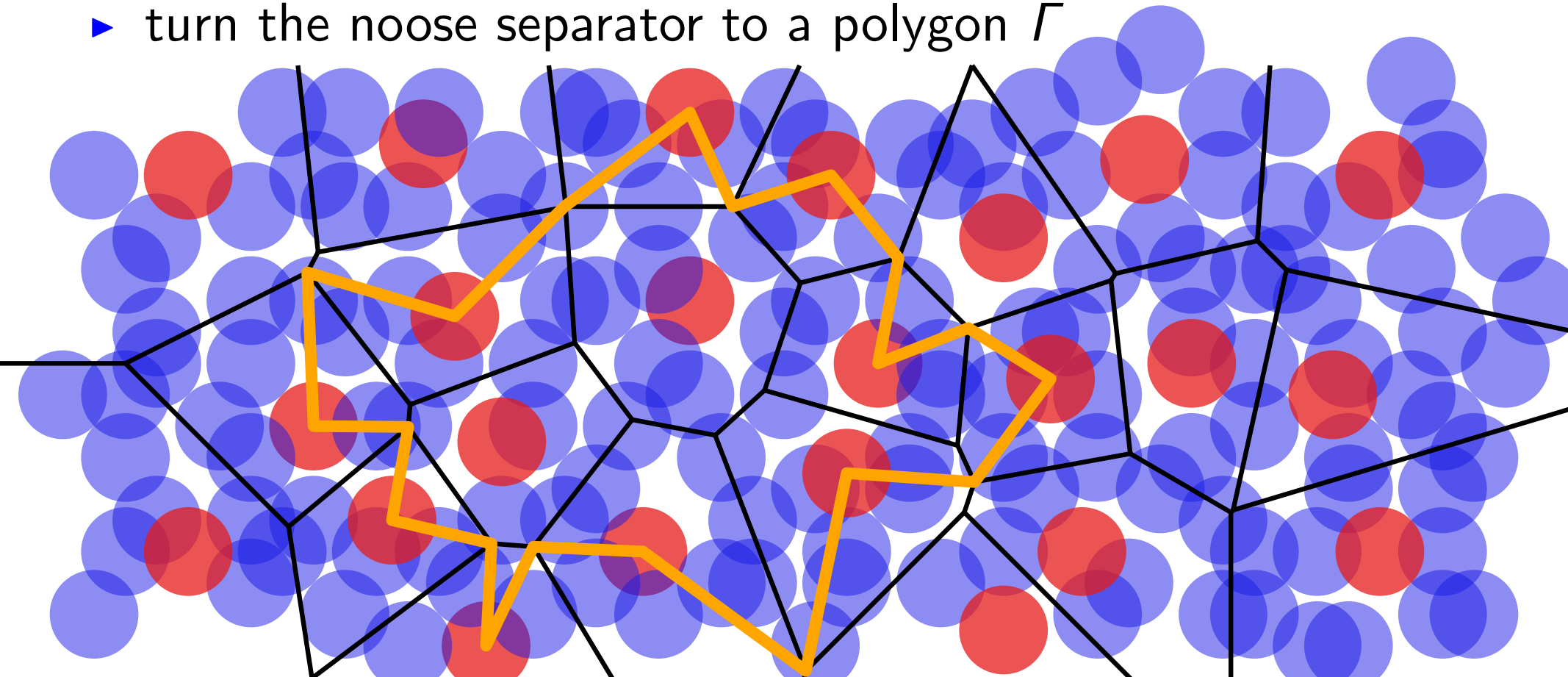
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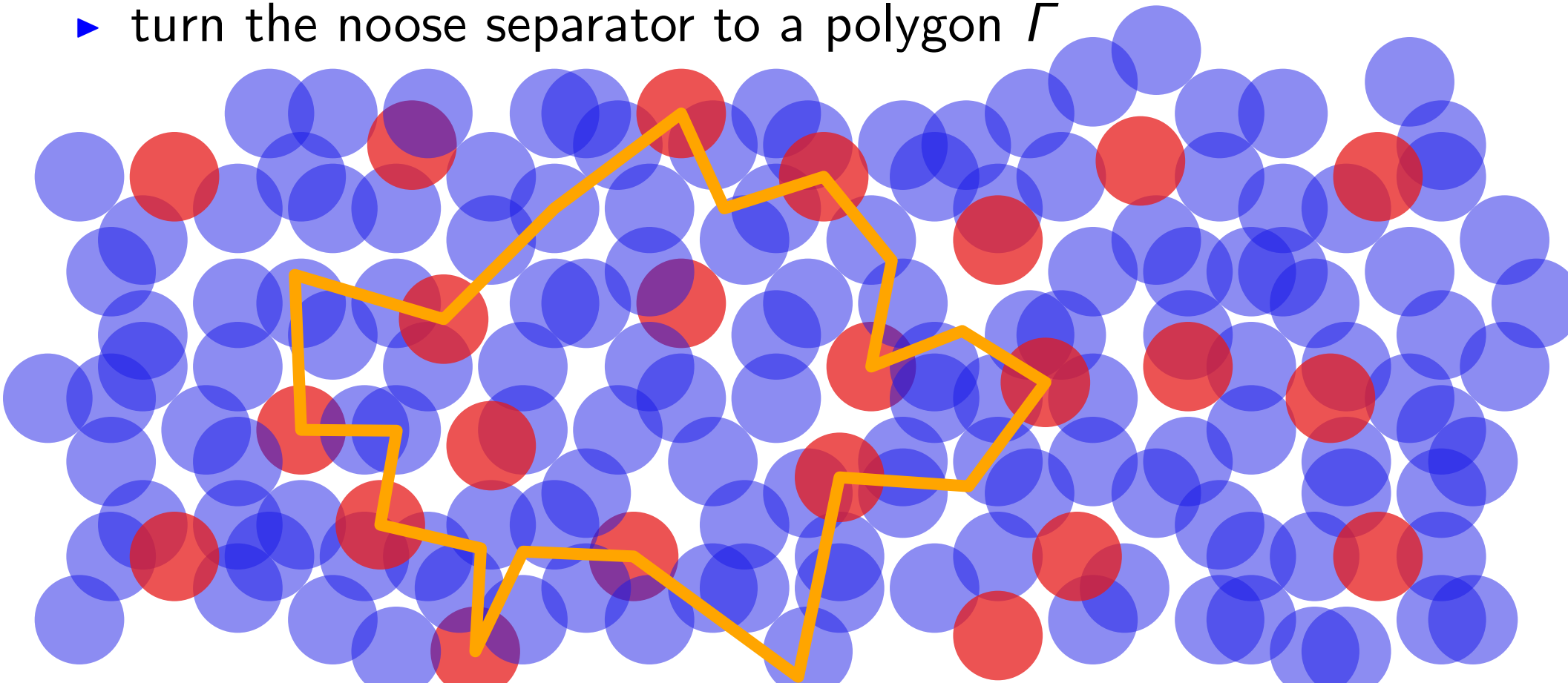
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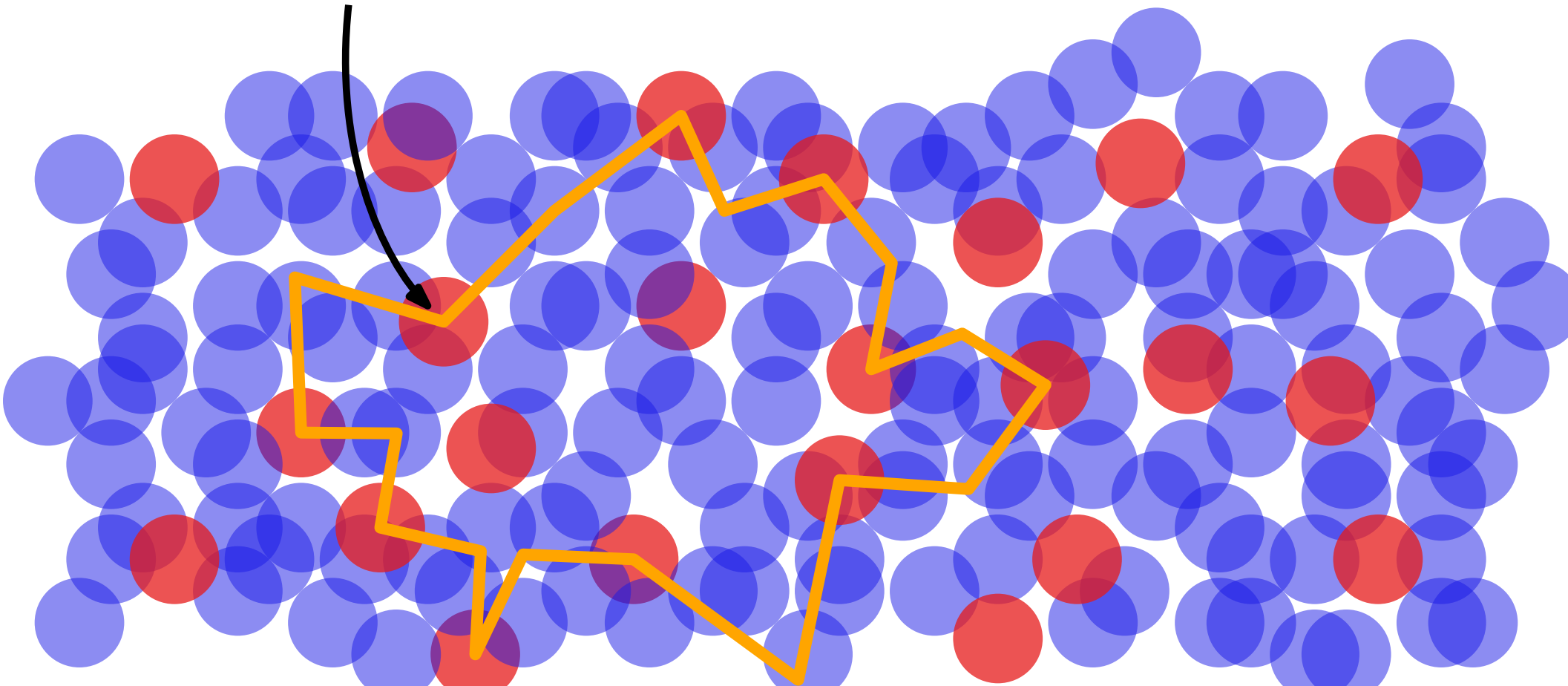
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Separators in a solution Voronoi diagram

- ▶ every disk touching the outline of the polygon or any of the disks on its vertices can be discarded

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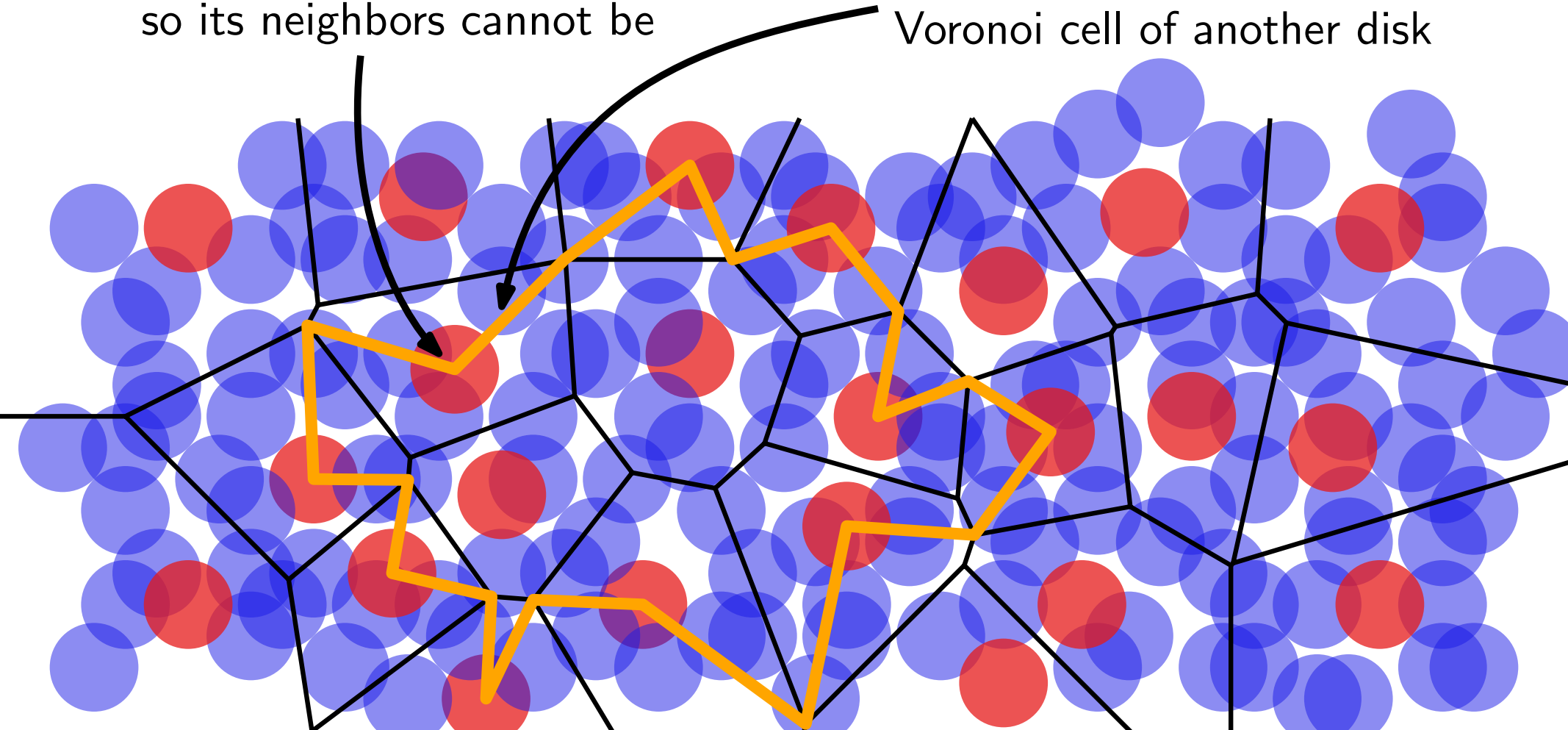


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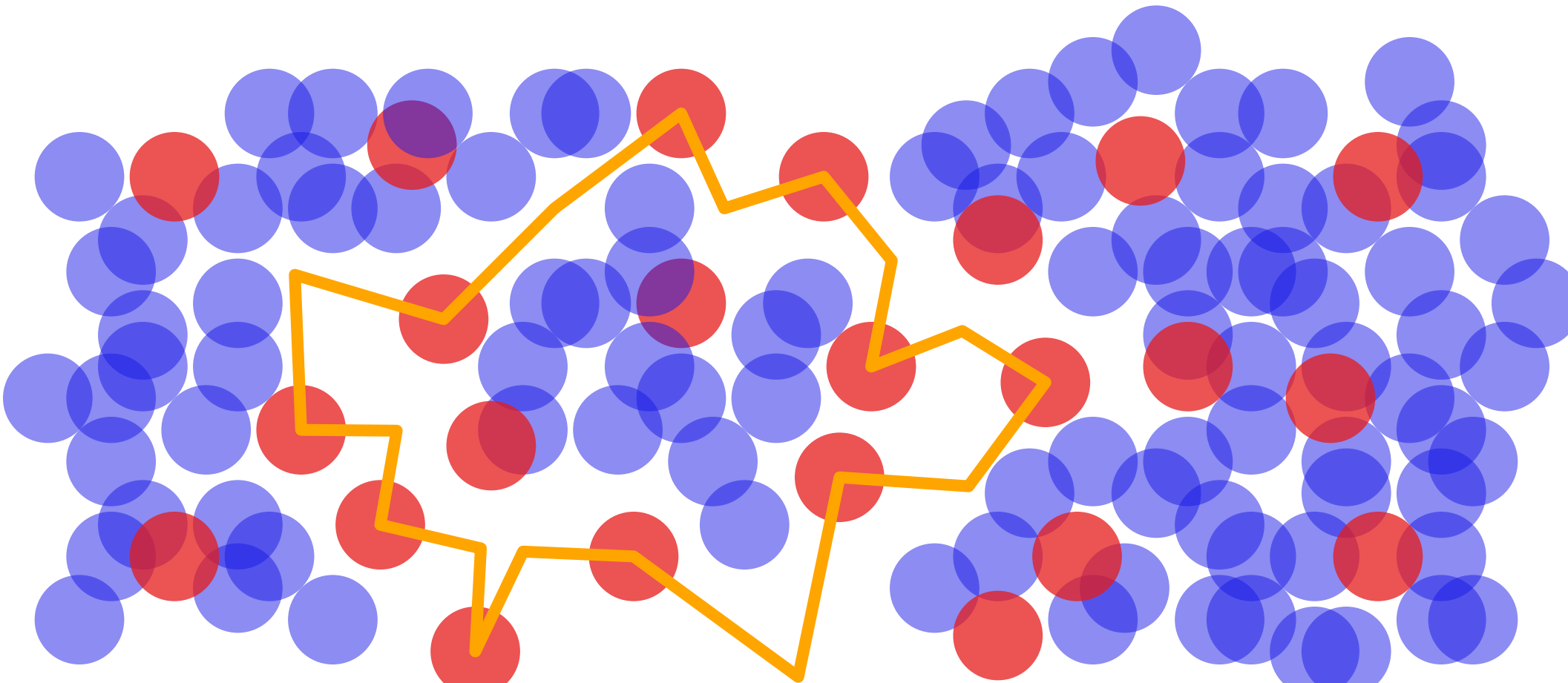
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Voronoi cell of another disk



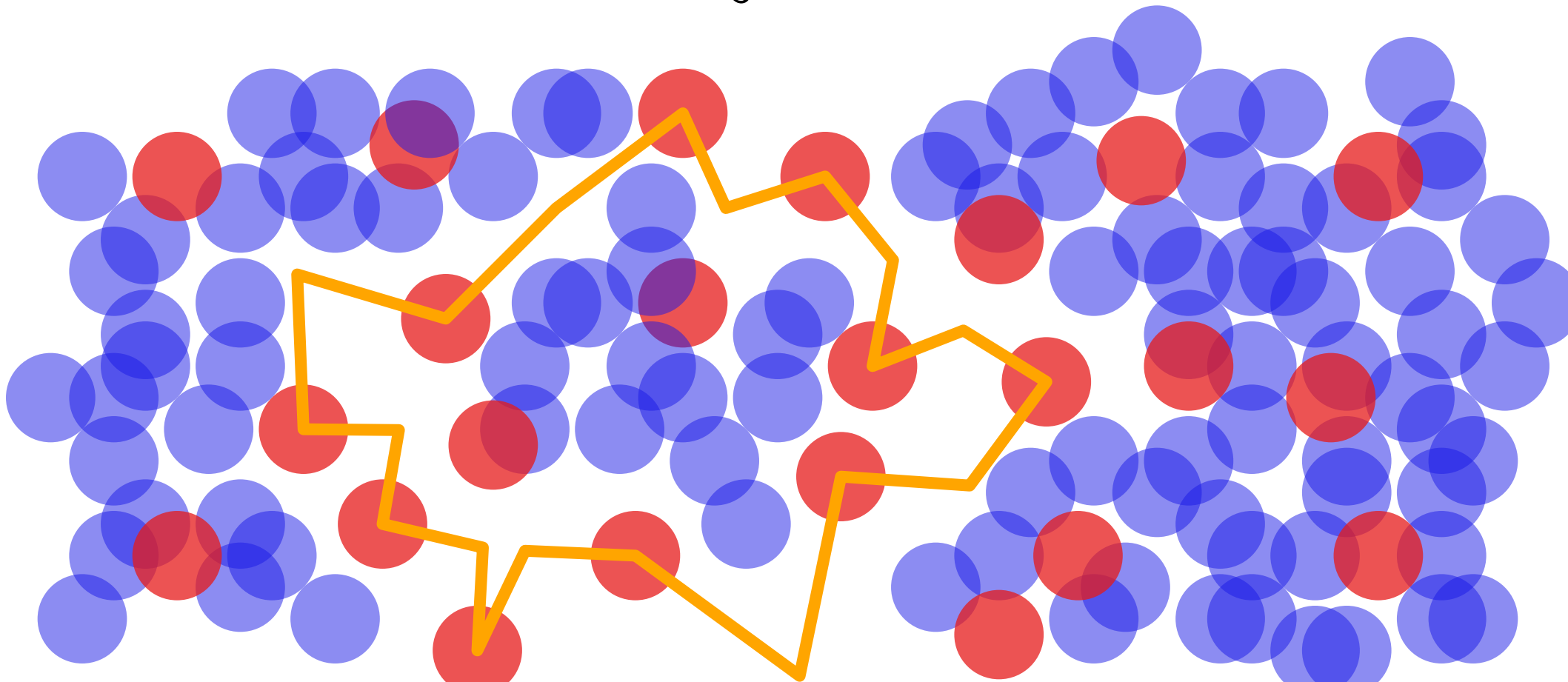
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Separators in a solution Voronoi diagram

- ▶ every disk touching the outline of the polygon or any of the disks on its vertices can be discarded
- ▶ apply recursion to disks inside and outside the polygon, we look for a solutions of size k_1, k_2 , where $k_1 + k_2 = k$ and $k_1, k_2 \leq \frac{2}{3}k$



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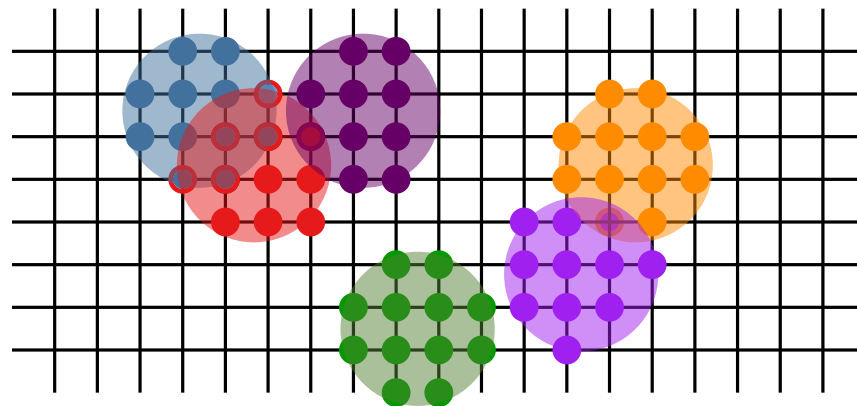
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$$T(n, k) \leq n^{\mathcal{O}(\sqrt{k})} \cdot k^2 \cdot 2T(n, \frac{2}{3}k) = n^{\mathcal{O}(\sqrt{k})}$$

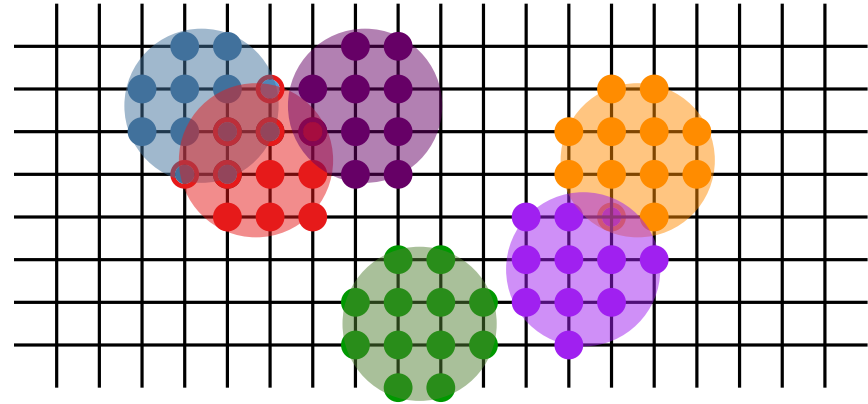
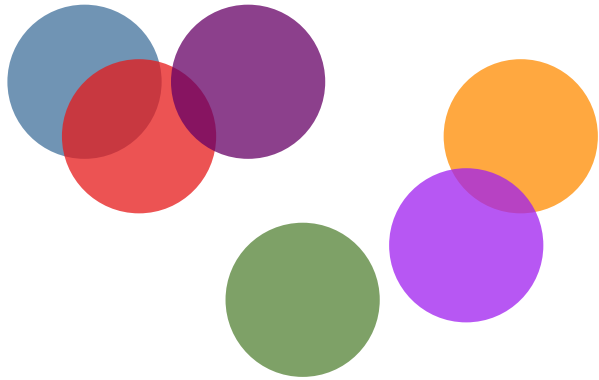
From disks to other geometric objects

- ▶ disks can be seen as connected subgraphs of a fine grid

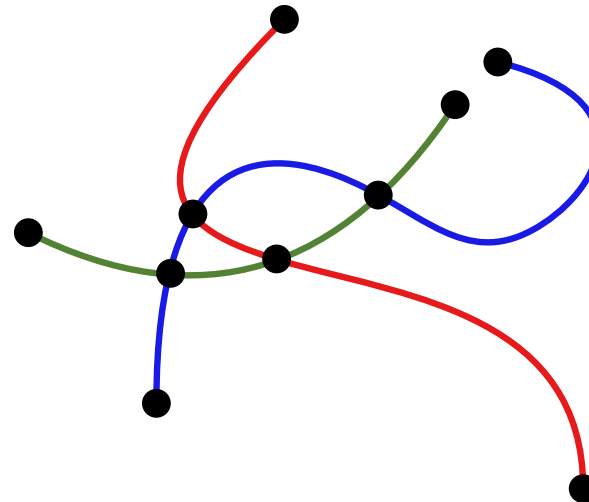
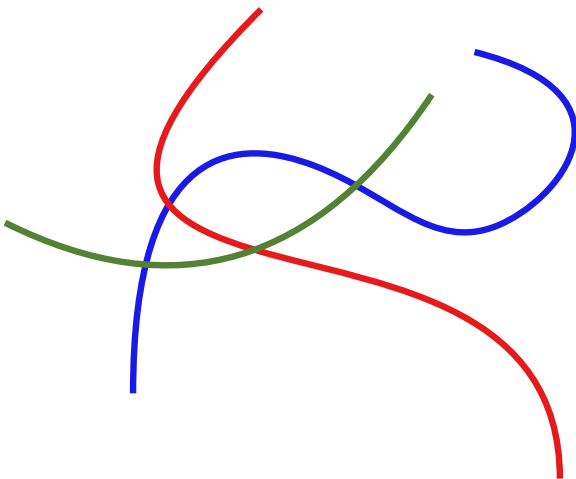


From disks to other geometric objects

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- ▶ string graphs = intersection graphs of connected subgraphs of planar graphs



General statement

- ▶ the whole approach can be re-interpreted in terms of packing disjoint subgraphs of planar graphs

Theorem [Marx, Pilipczuk '15].

Given a planar graph G with r vertices and n connected subgraphs of G , in time $n^{\mathcal{O}(\sqrt{k})} \cdot \text{poly}(r)$ we can decide if there is a collection of k disjoint subgraphs.

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- ▶ no assumptions on area
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- ▶ to some extent works also for covering variant (domination)

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- ▶ for disks and segments $r = \text{poly}(n)$
- ▶ **Open question**: For disk graphs, is there a **robust** algorithm for INDEPENDENT SET with complexity $2^{\mathcal{O}(k)}$ or $2^{\tilde{\mathcal{O}}(\sqrt{n})}$?

Lower bounds
for parameterized algorithms

Parameterized lower bounds

- ▶ we know that k -INDEPENDENT SET can be solved in time $n^{\mathcal{O}(\sqrt{k})}$ in disk graphs
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- ▶ we will need the following

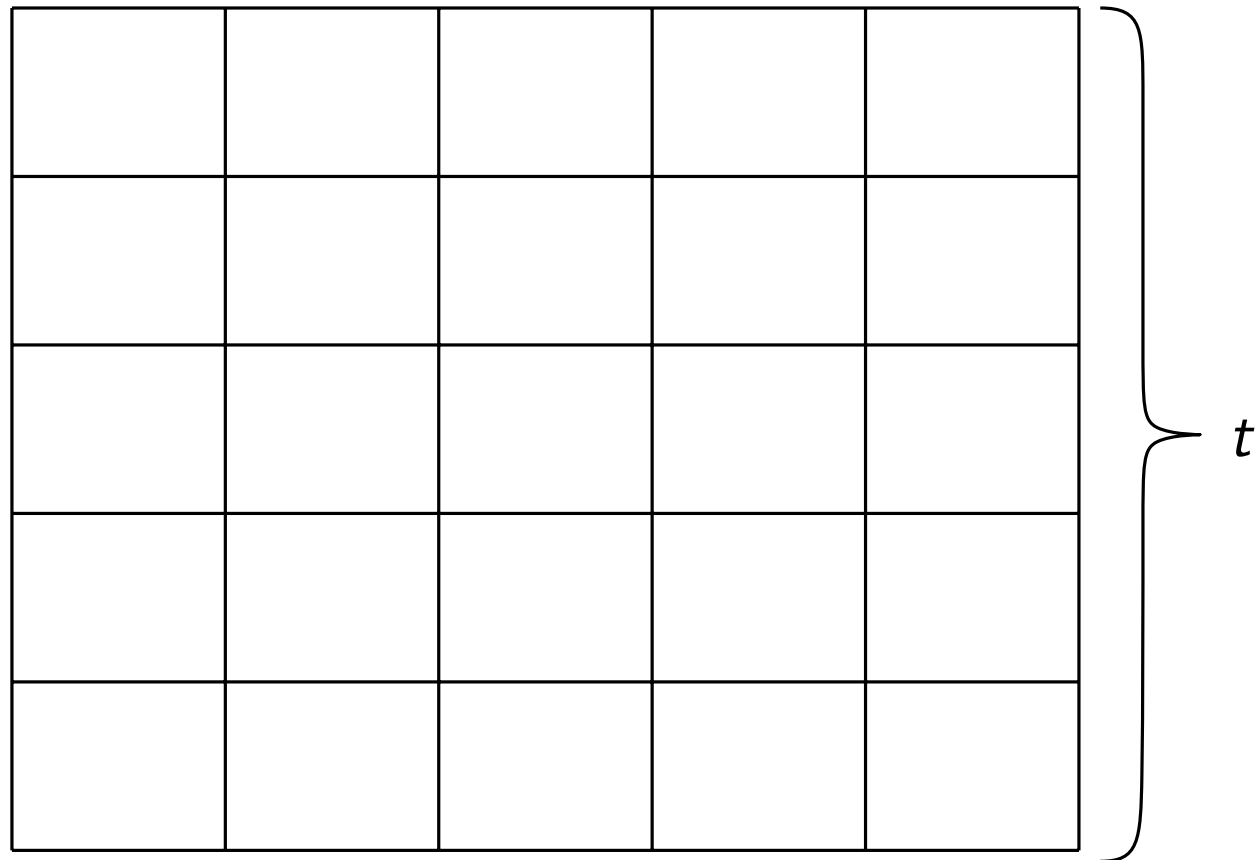
Theorem.

Assuming the ETH, k -CLIQUE cannot be solved in time $n^{o(k)}$.

- ▶ proof by a textbook reduction from 3-SAT

GRID TILING

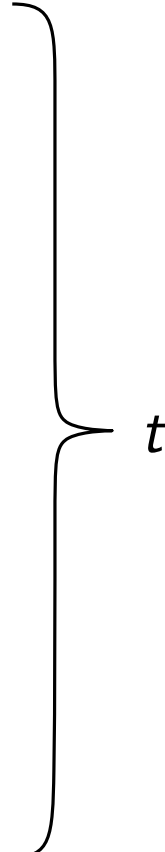
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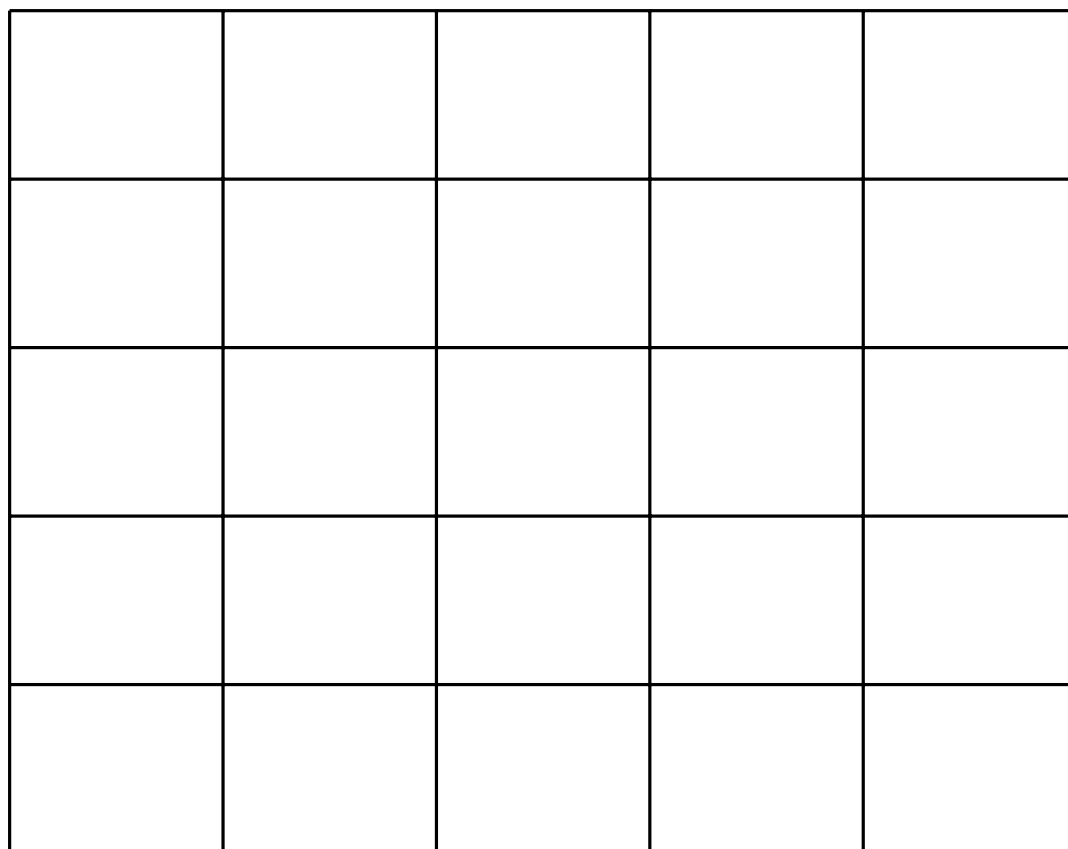
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- ▶ Sets for the cell (i, j) :

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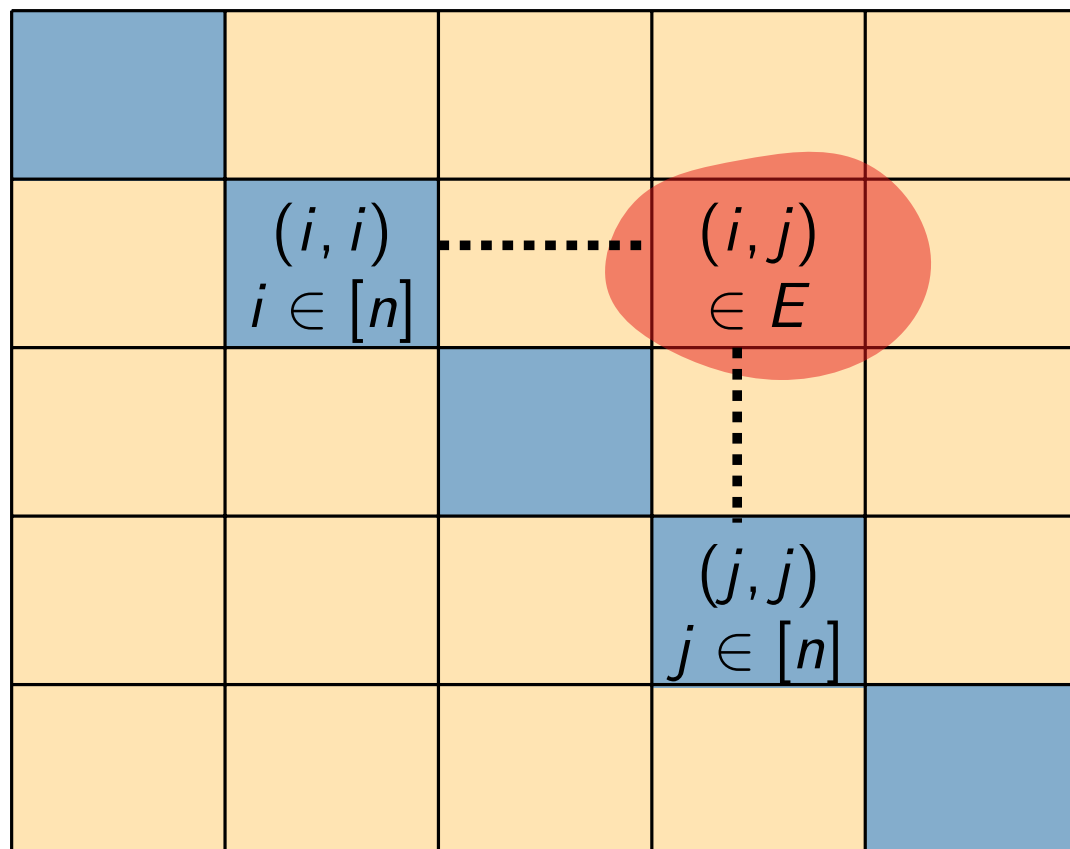
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(i, j) $ij \in [n]$	(i, i) $i \in [n]$	(i, j) $ij \in [n]$	(i, j) $ij \in [n]$	(i, j) $ij \in [n]$
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Hardness of GRID TILING

- ▶ $t \times t$ grid, each cell with some pairs from $[n] \times [n]$

Theorem. GRID TILING cannot be solved in time $n^{o(t)}$, unless the ETH fails.

- ▶ reduction from k -CLIQUE with vertices $1, 2, \dots, n$, $t = k$
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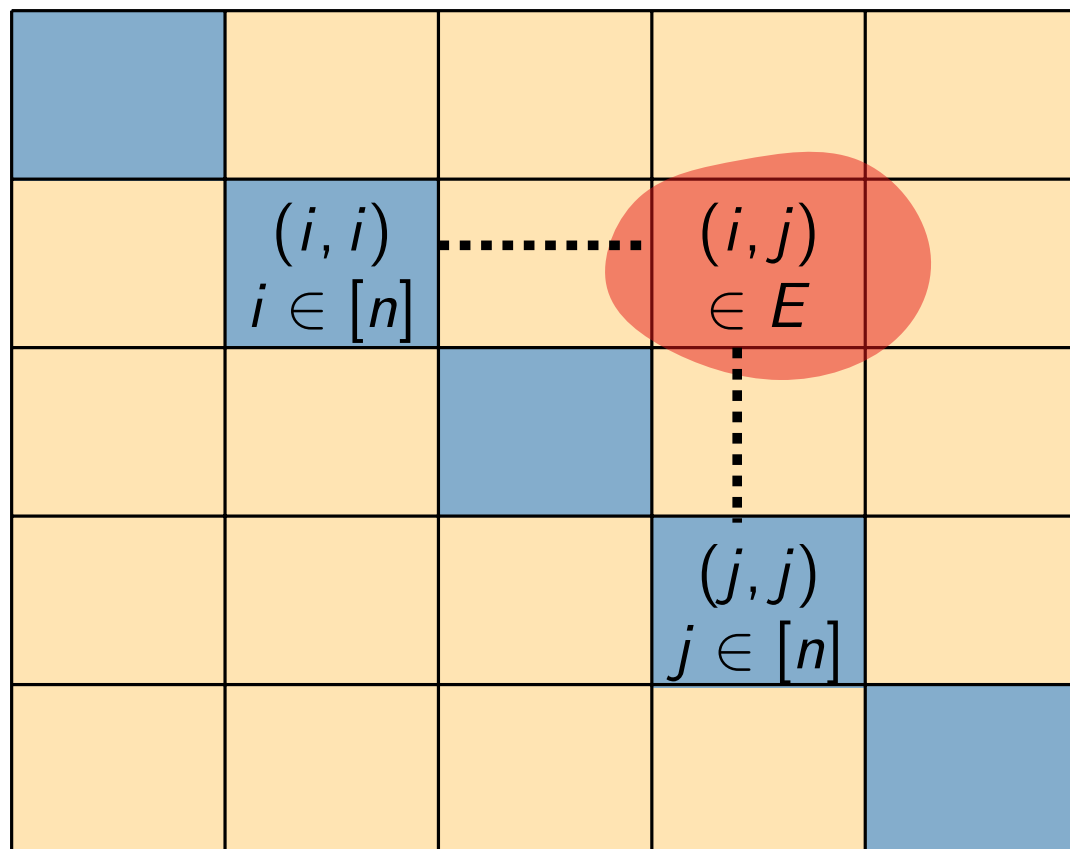


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GRID TILING

- ▶ we are given a square $t \times t$ grid
- ▶ in each cell (i, j) we have $S_{i,j} \subseteq [n] \times [n]$
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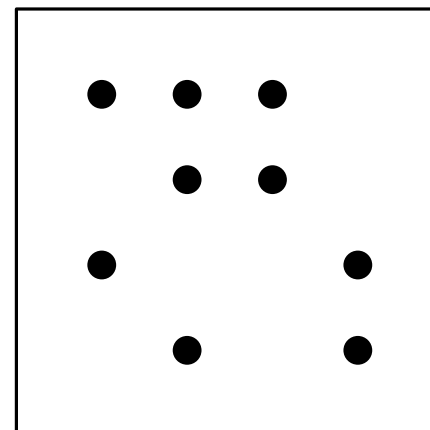
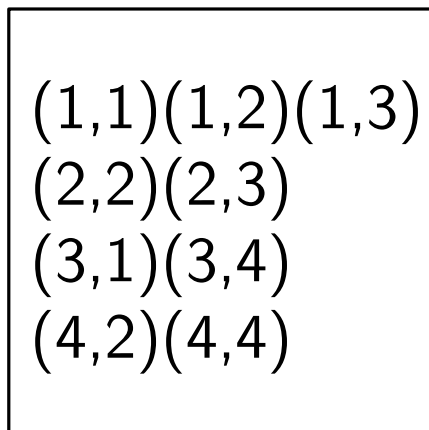
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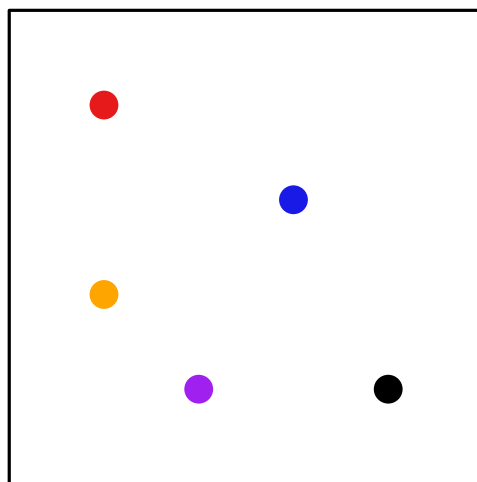


Hardness of INDEPENDENT SET in UDGs

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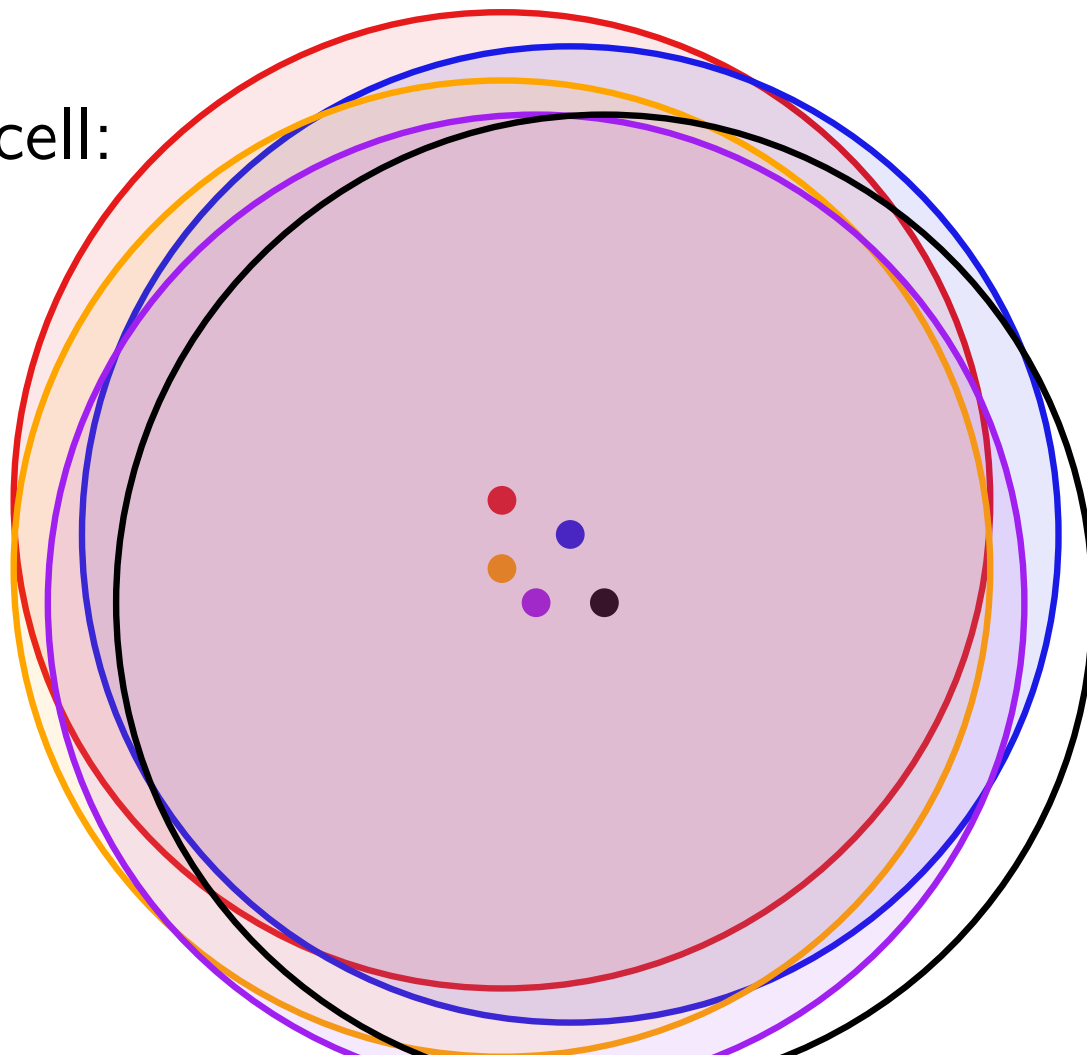
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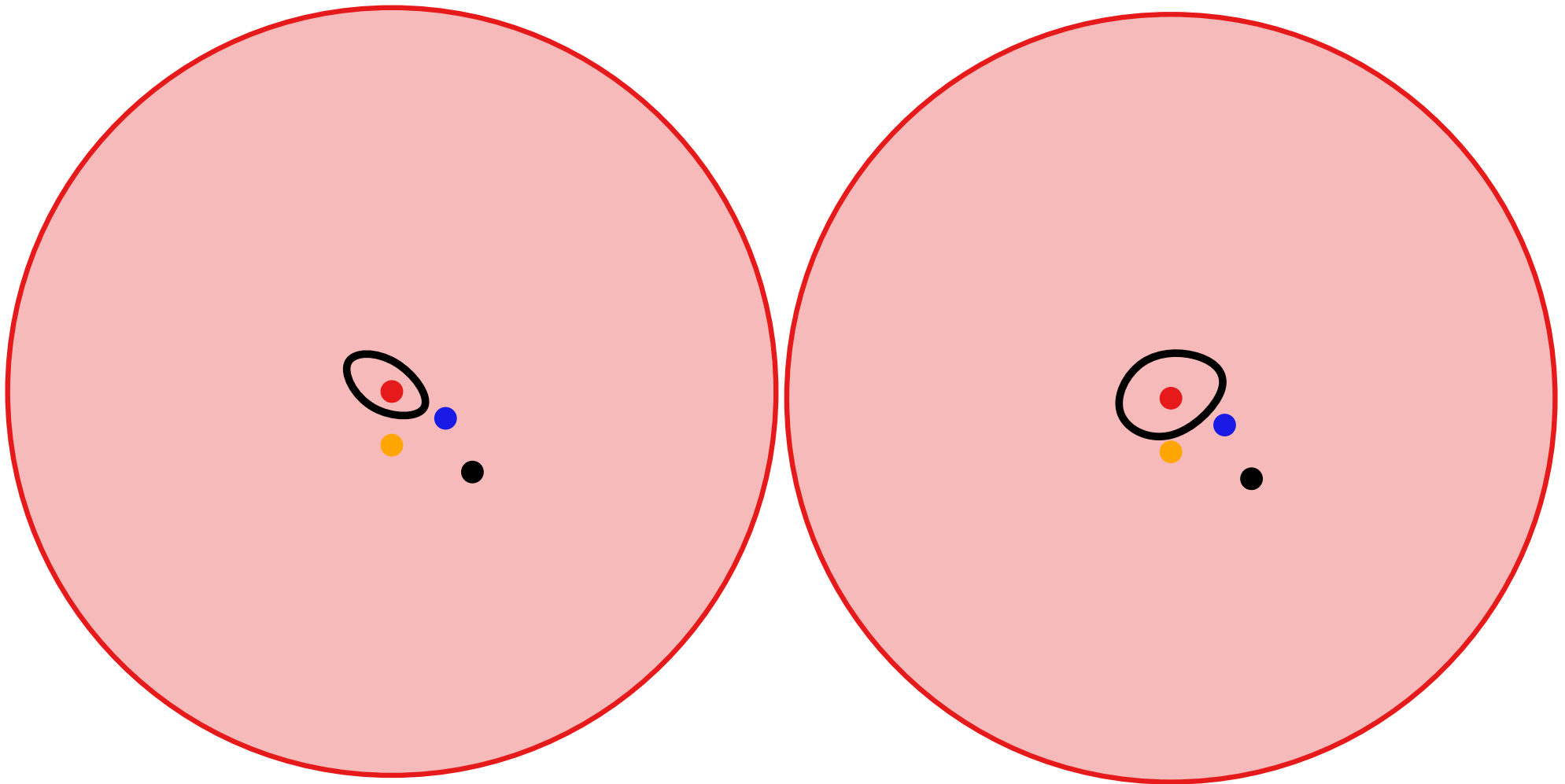
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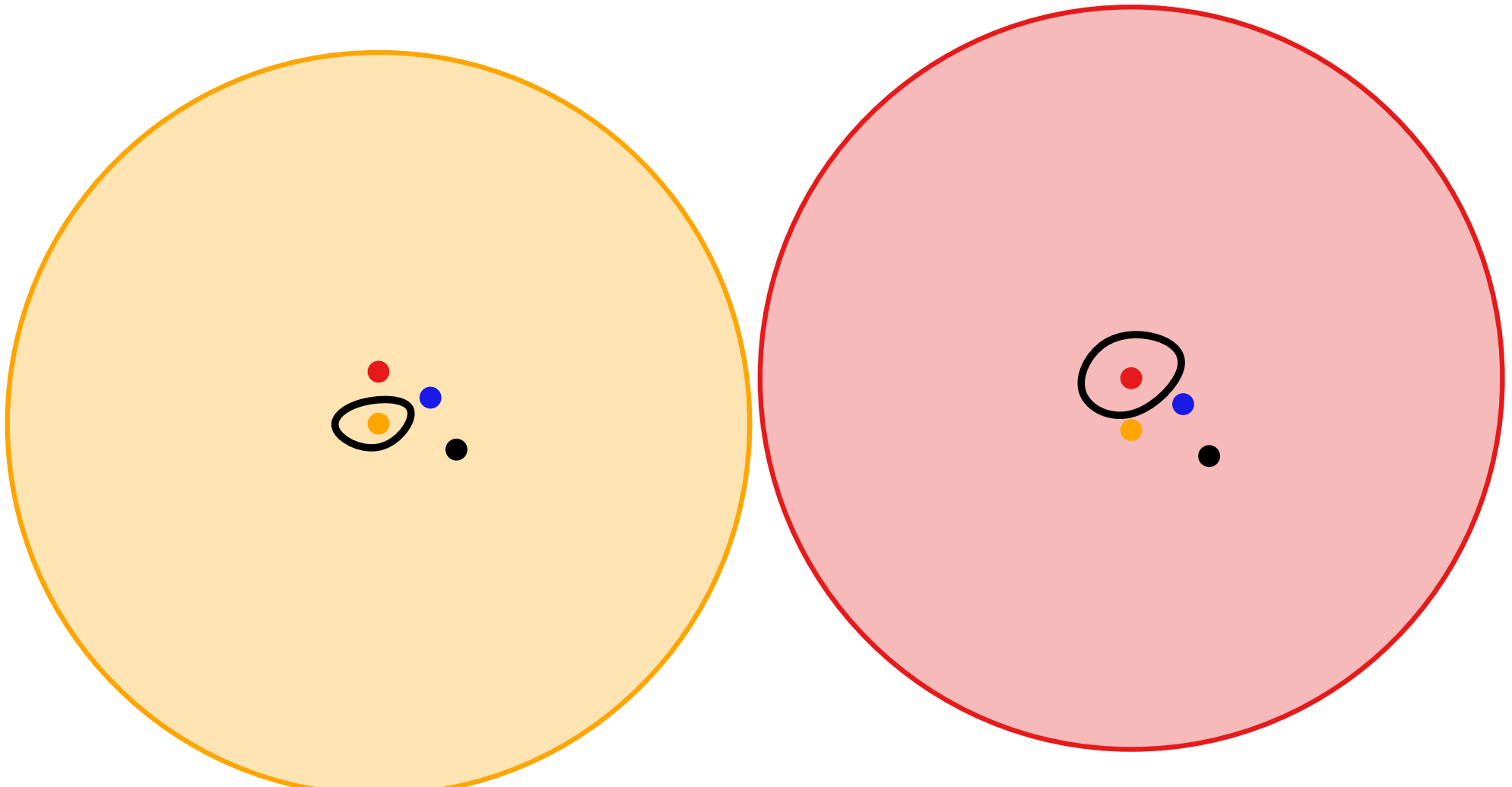
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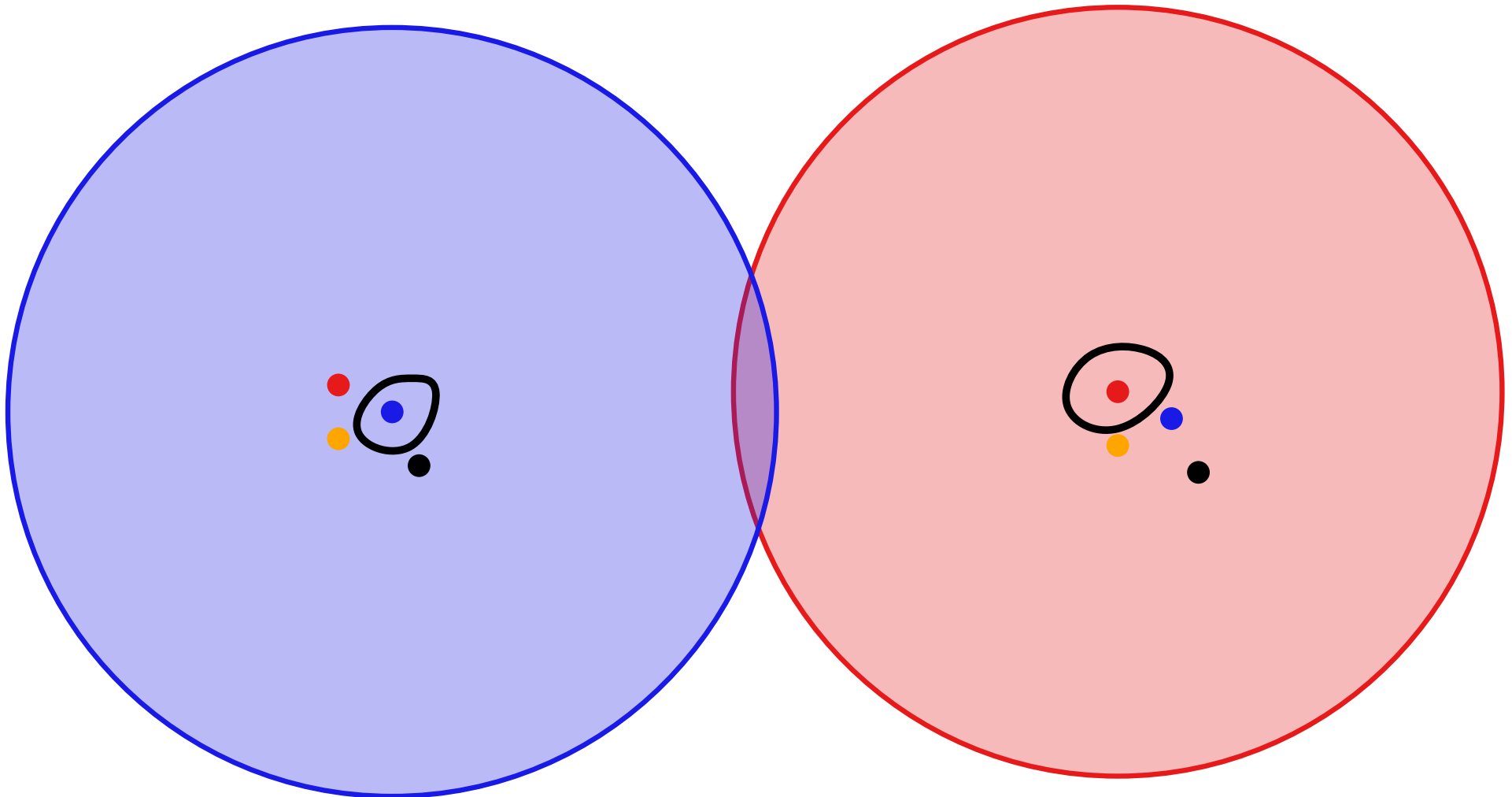
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- ▶ number of disks $N \leq t^2 \cdot n^2$
- ▶ solving INDEPENDENT SET in time $N^{o(\sqrt{k})}$
 \rightarrow solving GRID TILING in time $n^{o(t)} \rightarrow$ the ETH fails \square

Other faces of GRID TILING

- ▶ similar approach can be used to show lower bounds for (CONNECTED) DOMINATING SET [Marx + Kisfaludi-Bak]
- ▶ reductions are not specific to disks: in general they can be adjusted for any convex fat shapes

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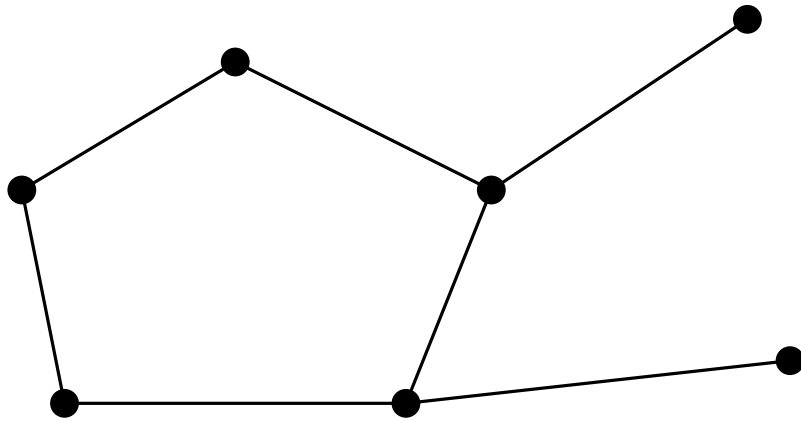
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... but it's a different story

Bidimensionality in geometric graphs

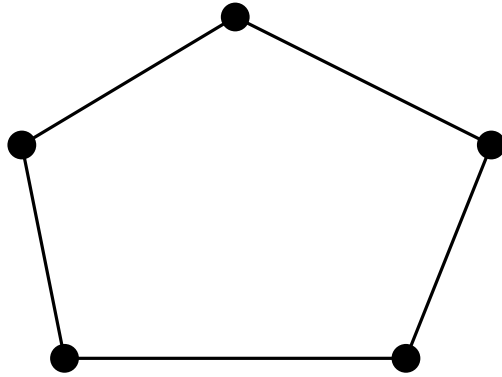
Minors

- ▶ **minor** = a graph obtained by deleting vertices/edges and contracting edges



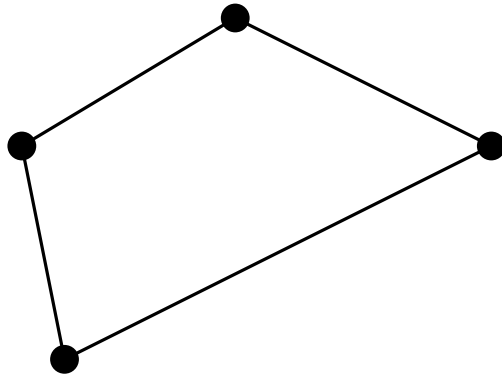
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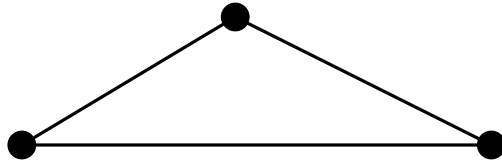
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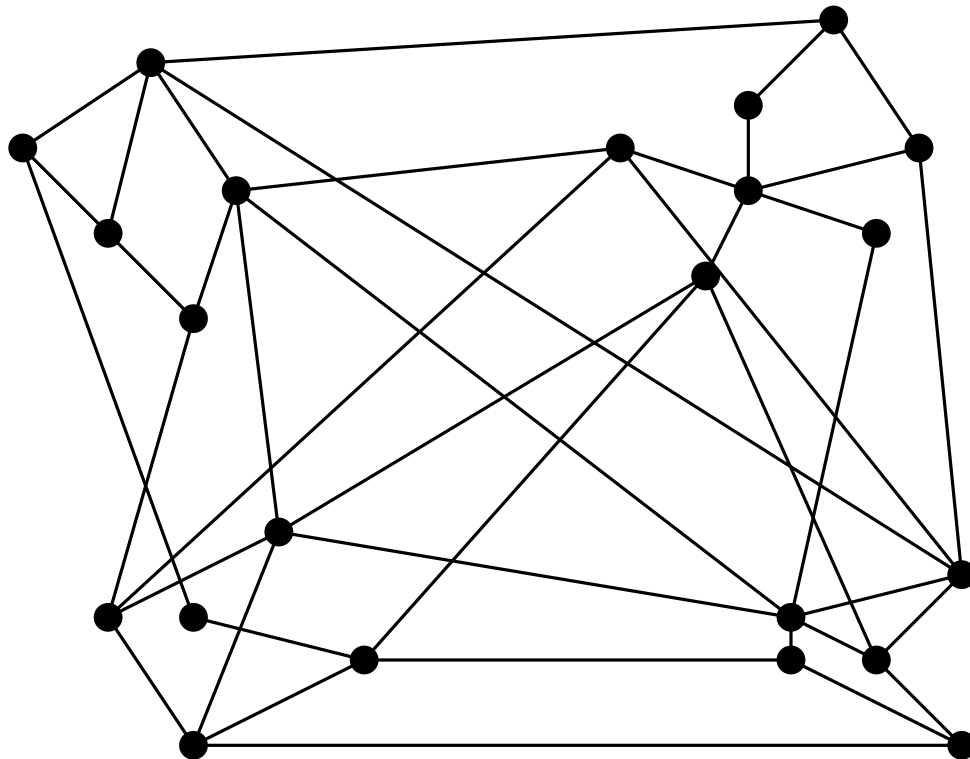
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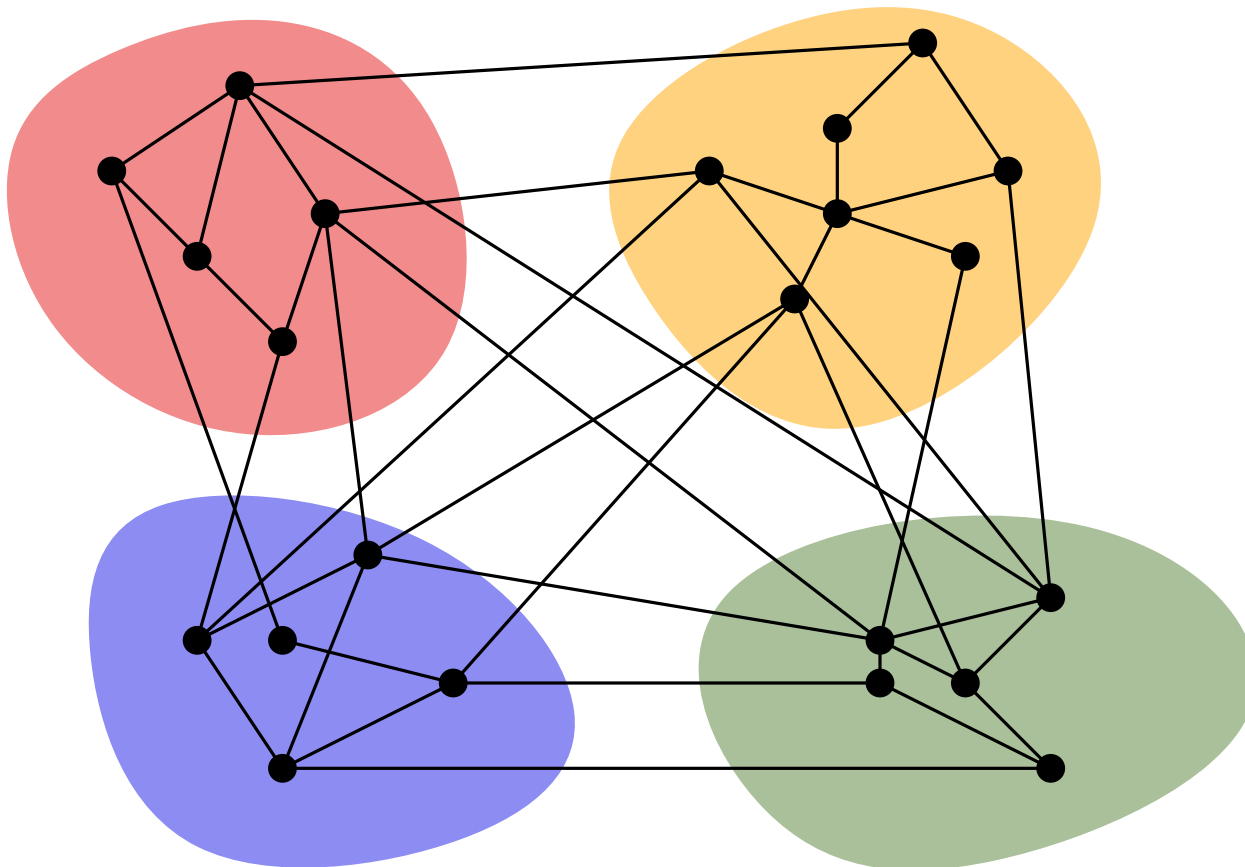
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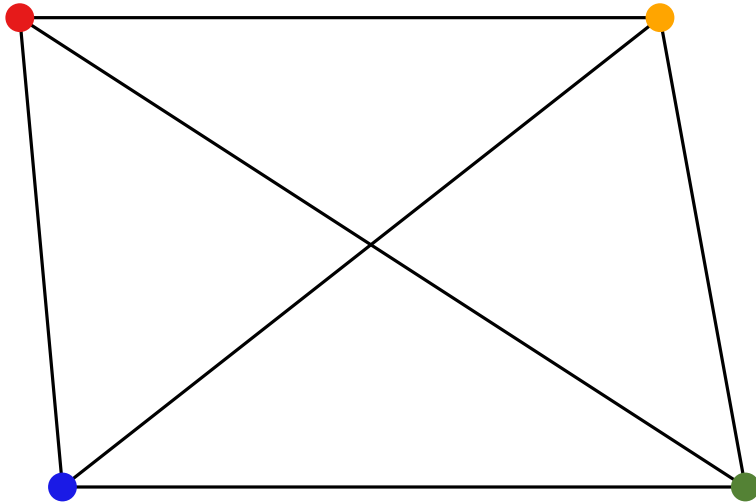
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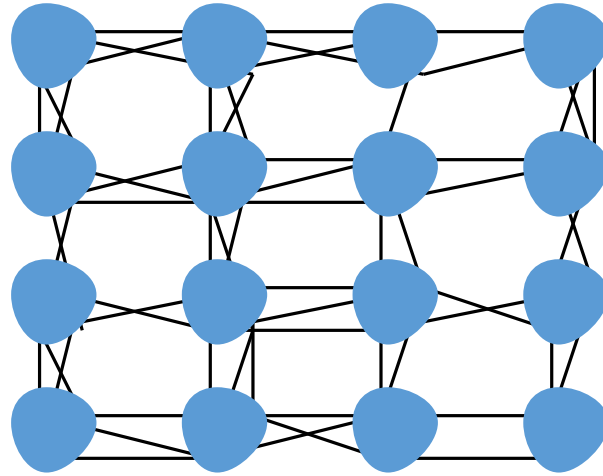
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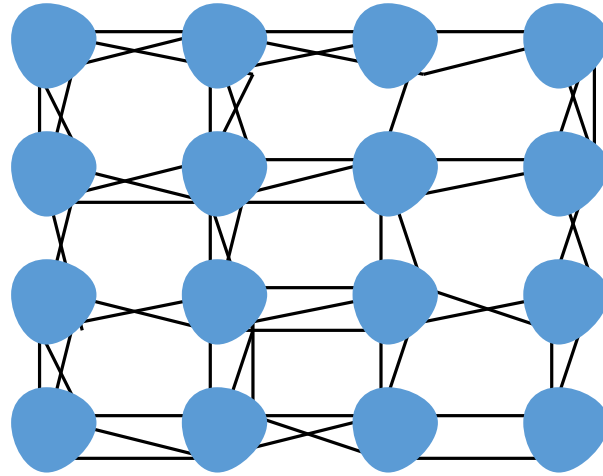
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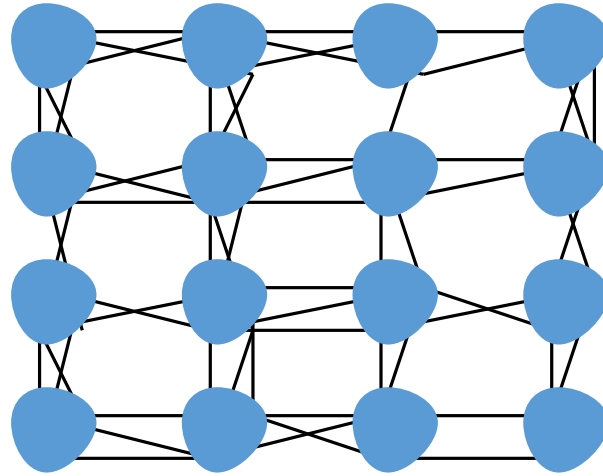


Grid minor theorem [Robertson, Seymour '86].

Every graph with treewidth $\geq f(t)$ contains a $t \times t$ grid minor.

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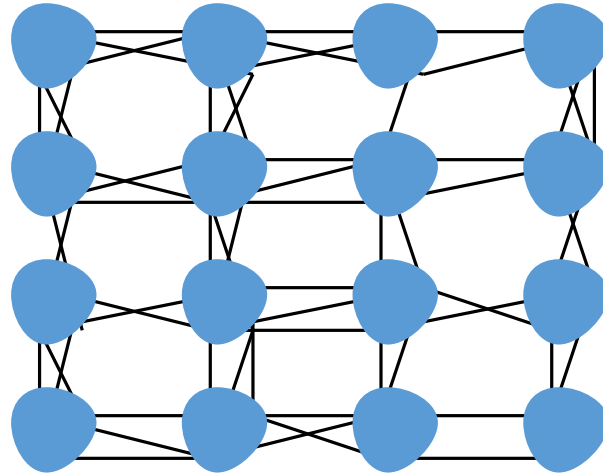


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Planar grid minor theorem [Robertson, Seymour, Thomas '94, Gu, Tamaki '12].

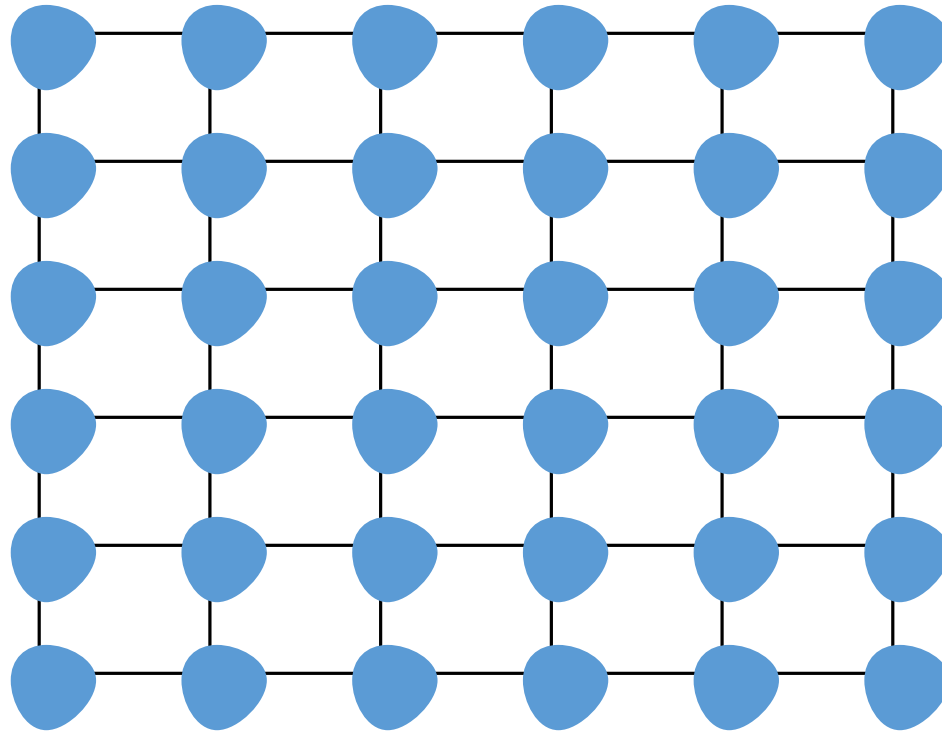
Every **planar** graph with treewidth $\geq 9/2 \cdot t$ contains a $t \times t$ grid minor. There is a poly-time algorithm for finding a grid or a tree decomposition.

Bidimensionality for planar graphs

- ▶ if treewidth is $\mathcal{O}(\sqrt{k})$, then many problem can be solved in time $2^{\tilde{\mathcal{O}}(\sqrt{k})} \cdot \text{poly}(n)$

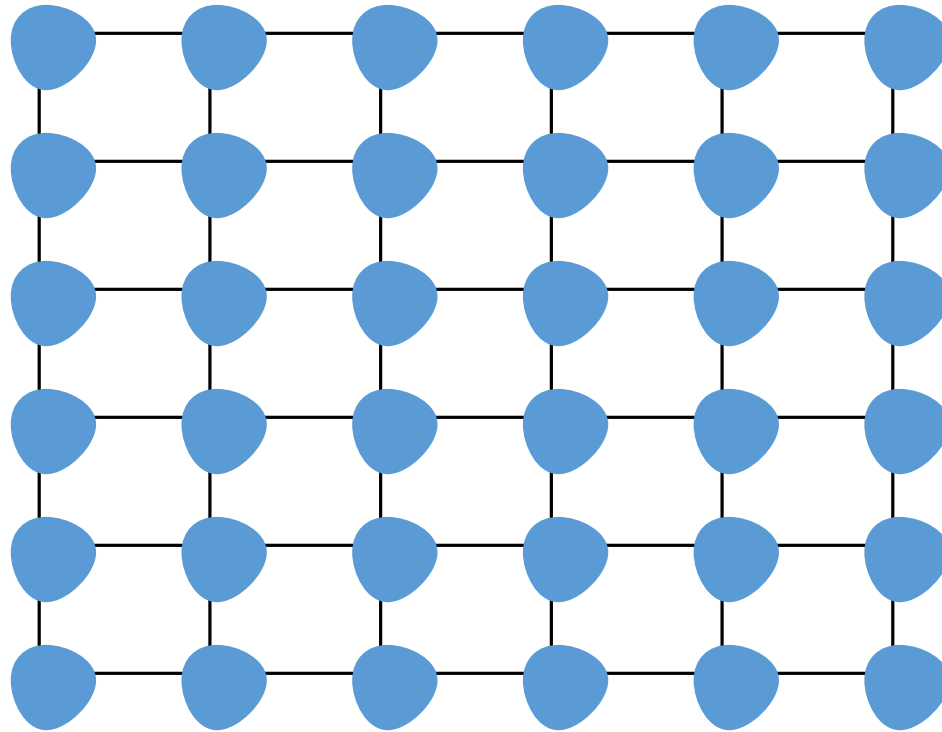
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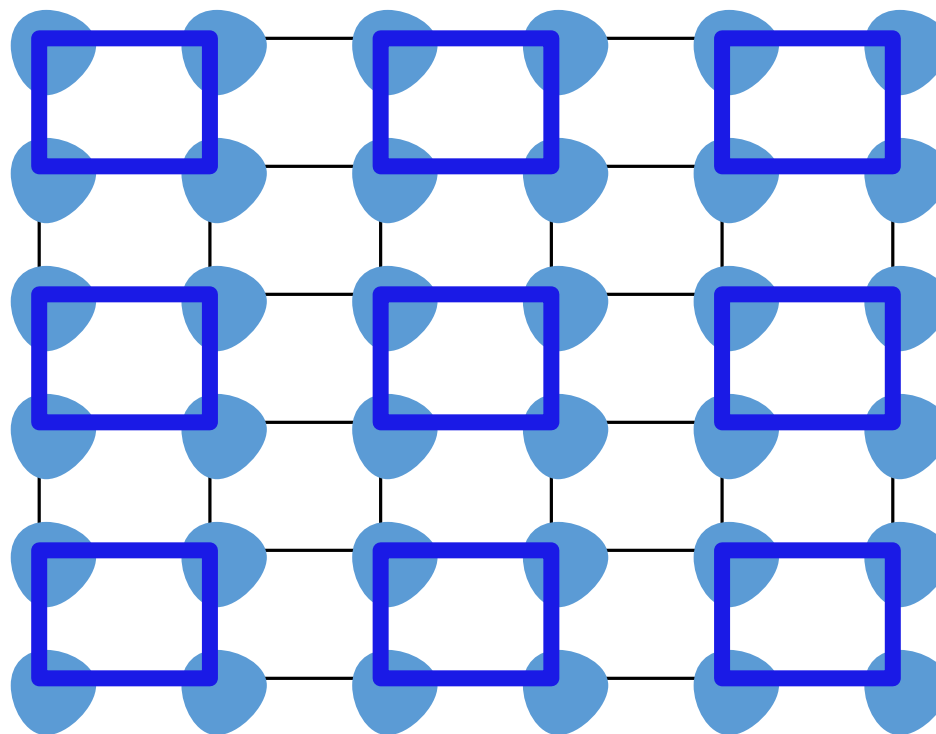
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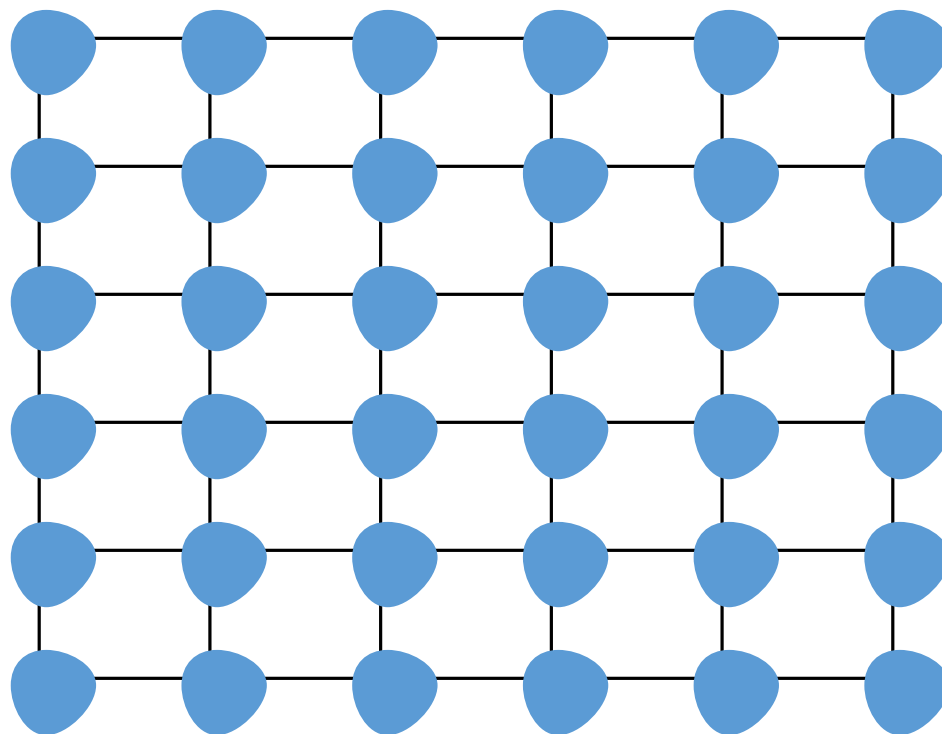


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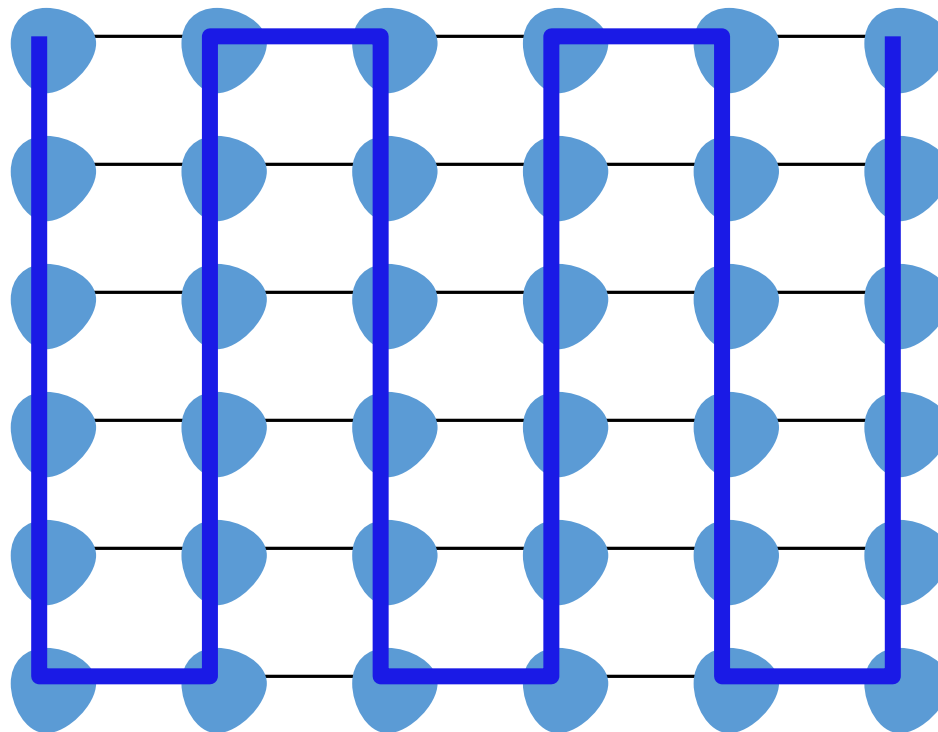
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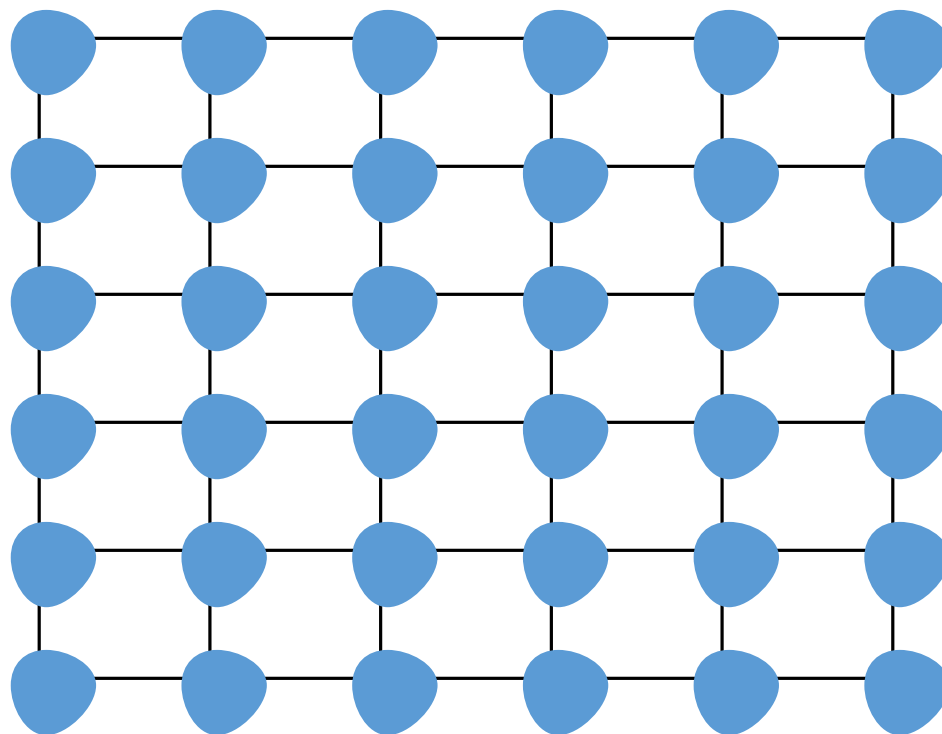


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- ▶ $2^{\tilde{\mathcal{O}}(\sqrt{k})} \cdot \text{poly}(n)$ -algorithms for many parameterized problems

Grid minors in unit disk graphs

- ▶ we aim to prove a grid minor theorem for unit disk graphs

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Lemma [Fomin, Lokshtanov, Saurabh '11].

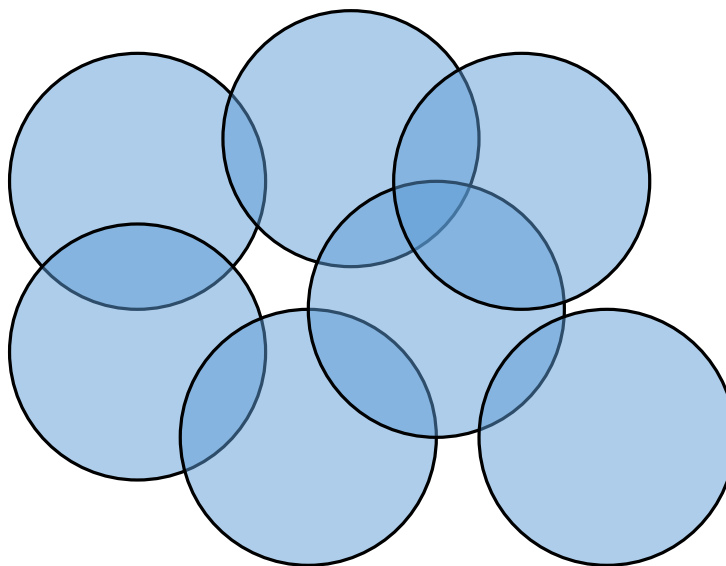
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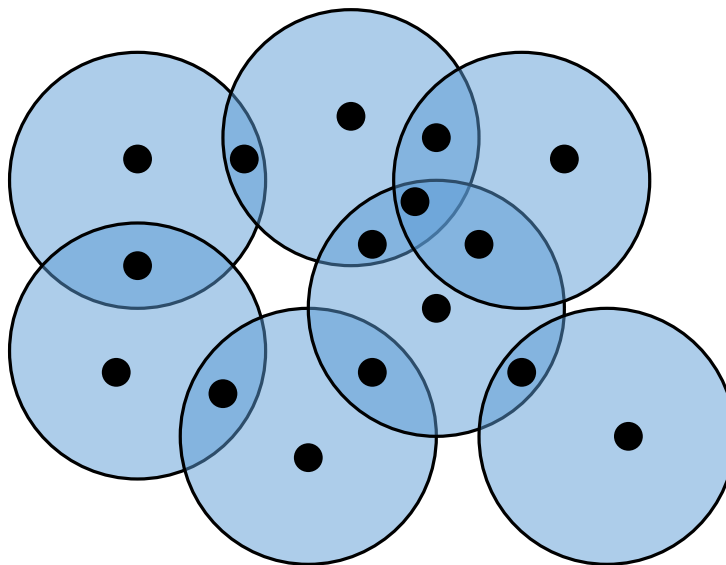


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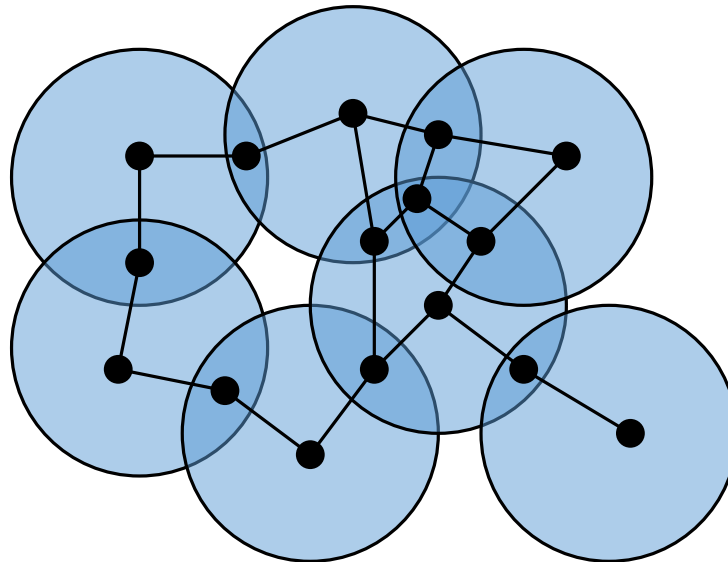


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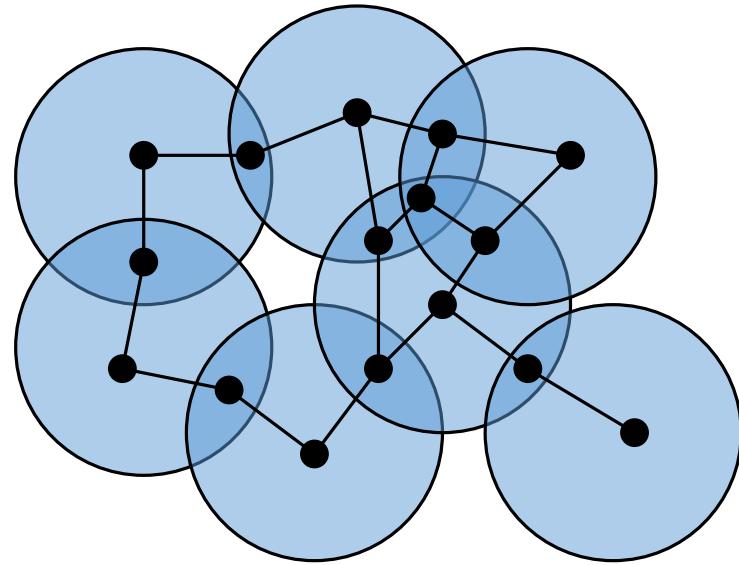
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- ▶ $R(G)$ – region graph, $R(G)$ is planar

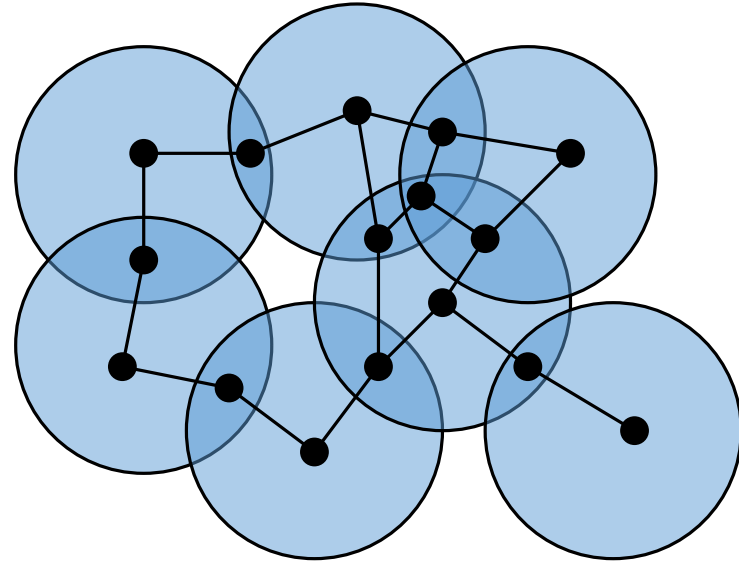
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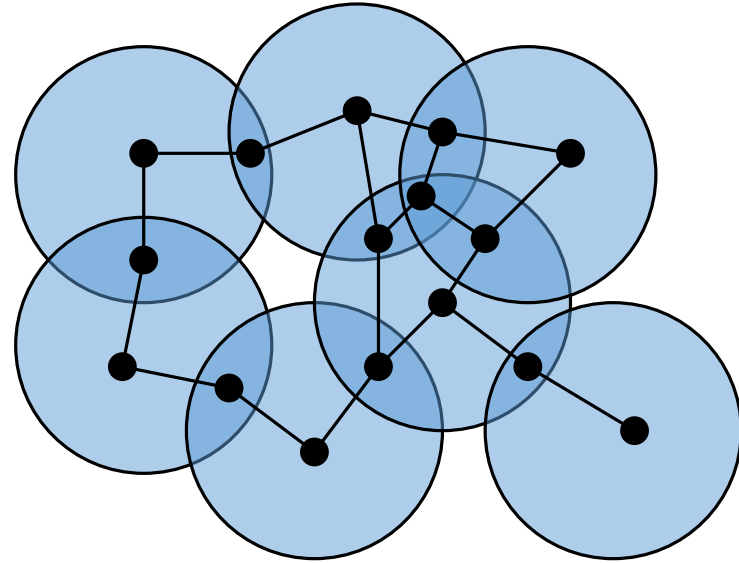


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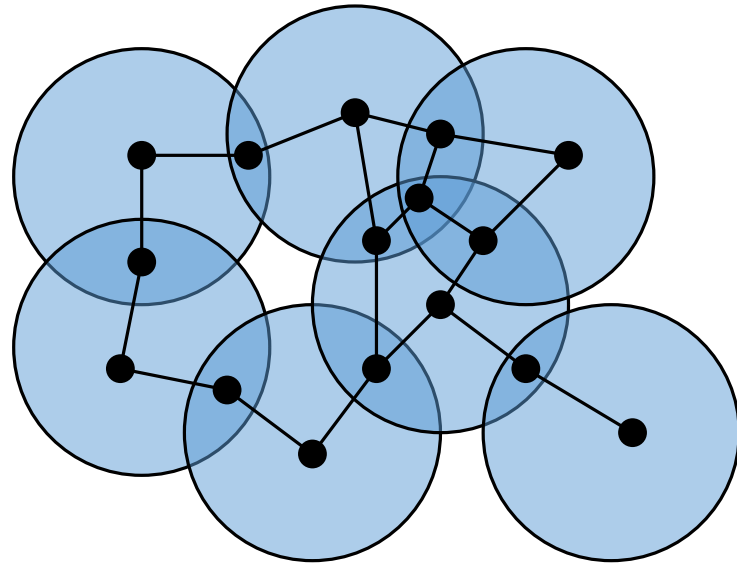
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- ▶ using this, we construct a $t' \times t'$ grid minor in G , where $t' = \mathcal{O}(t) = \mathcal{O}(\text{tw}(G))$

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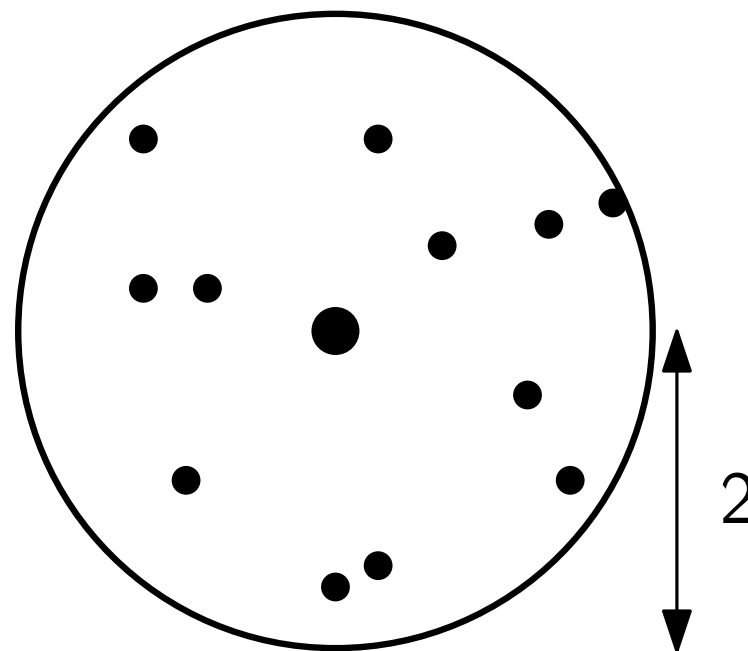
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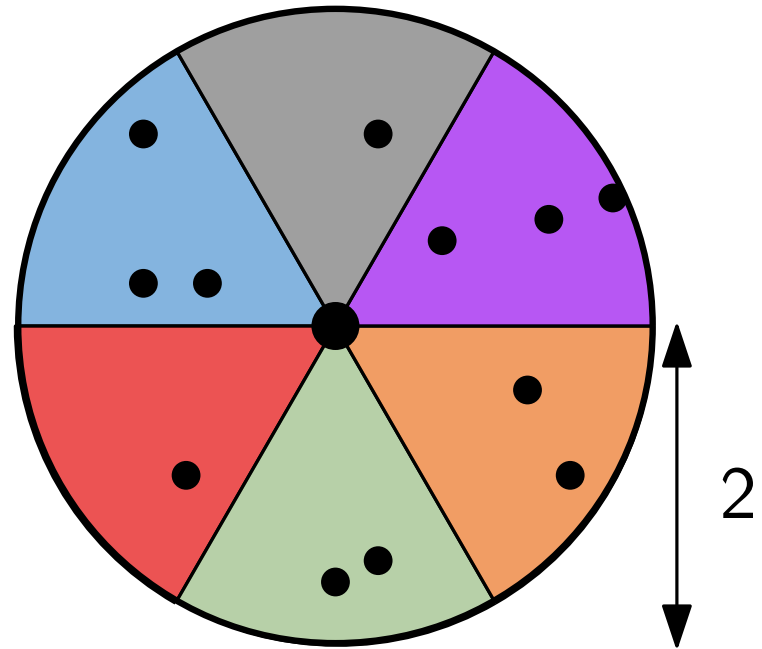


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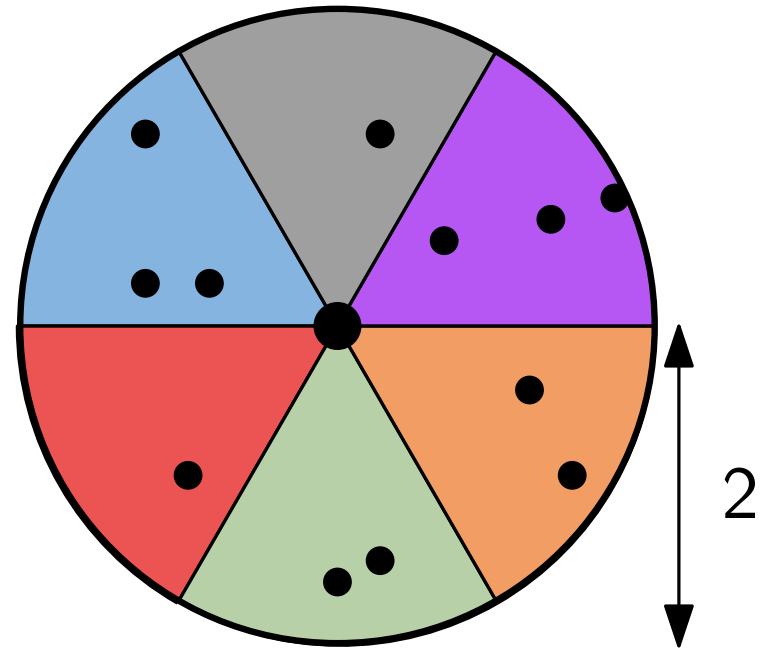


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- ▶ centers in each region correspond to a clique
- ▶ add some technical magic



Theorem [FLS '11].

Every unit disk graph with no p -clique and treewidth $\Omega(p \cdot t)$ has a $t \times t$ grid minor.

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Overall running time is $2^{\mathcal{O}(k^{0.75} \cdot \log k)} \cdot \text{poly}(n)$.

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