

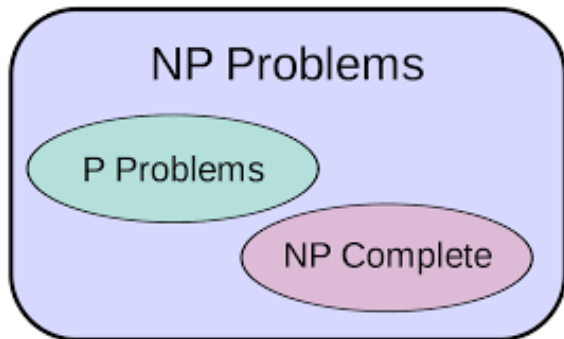
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# Subexponential algorithms in non sparse classes of graphs

Édouard Bonnet

Department of Computer Science, Middlesex University, London

Lyon, May 15th, 2017



**not all the NP-complete problems are as hard when one looks at their optimal running time**

## Subexponential algorithms

NP-hardness:

your problem is not solvable in polytime, unless 3-SAT is.  
very widely believed but do not give an evidence against  
algorithms running in, say,  $2^{n^{1/100}}$ .

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ETH-hardness:

stronger assumption than  $P \neq NP$  is ETH asserting that no  
 $2^{o(n)}$  algorithm exists for 3-SAT

Allows to prove stronger conditional lower bounds

linear reduction from 3-SAT: no  $2^{o(n)}$  algorithm for your  
problem, quadratic reduction: no  $2^{o(\sqrt{n})}$  algorithm, etc.

## Biased viewpoint of this talk

$2^{O(\sqrt{n})}$  (or at least  $2^{O(n^c)}$  with  $c < 1$ ) vs no  $2^{o(n)}$  under ETH?

For optimisation problems:  $n^{O(\sqrt{k})}$  vs no  $n^{o(k)}$  (or  $n^{o(k/\log k)}$ )?

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$n^{O(\sqrt{k})}$  often  $\rightsquigarrow 2^{O(\sqrt{n} \log n)}$  because  $k$  often  $\leq n$ .

Notable exception: CHORDAL COMPLETION can even be solved in  $2^{O(\sqrt{k} \log k)}$  but not in  $2^{o(n)}$  under ETH ( $k$  can be  $\Omega(n^2)$ ).

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We will focus on geometric non necessarily sparse graphs:

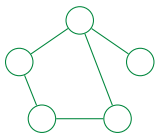
intersection graphs: disks, balls, segments, strings, etc.

visibility graphs.

## Sparse classes and dense classes

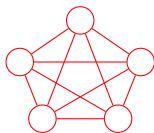
sparse class  $\mathcal{C}$ :  $\exists \alpha_{\mathcal{C}}, \forall G \in \mathcal{C}$  such that  $|E(G)| \leq \alpha_{\mathcal{C}}|V(G)|$ .

dense class  $\mathcal{C}$ :  $\exists \alpha_{\mathcal{C}}$  and infinitely many graphs  $G \in \mathcal{C}$  with  $|E(G)| \geq \alpha_{\mathcal{C}}|V(G)|^2$ .



sparse

vs



dense



## Examples

Sparse classes:

forests (with  $\alpha_{\mathcal{C}} = 1$ )

3-regular graphs (with  $\alpha_{\mathcal{C}} = 3/2$ )

planar graphs (with  $\alpha_{\mathcal{C}} = 3$ )

graphs with average degree bounded by  $d$  (with  $\alpha_{\mathcal{C}} = d/2$ )

Dense classes:

general graphs

chordal graphs

intersection graphs of disks

cliques

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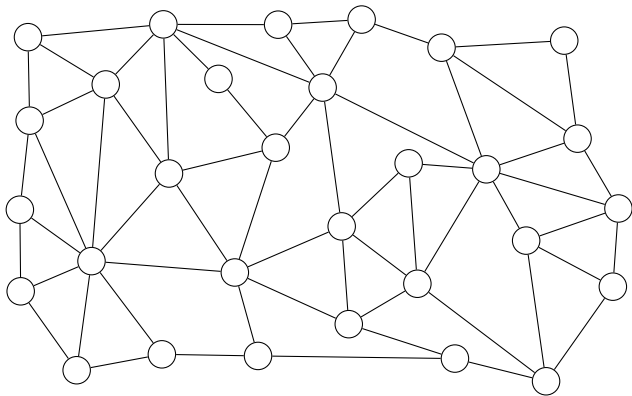
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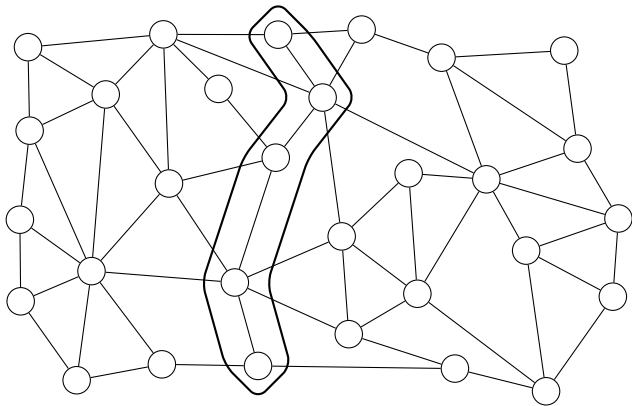
**Planar graphs are especially nice sparse graphs since they admit *small* balanced separators...**

## Square root phenomenon on planar graphs



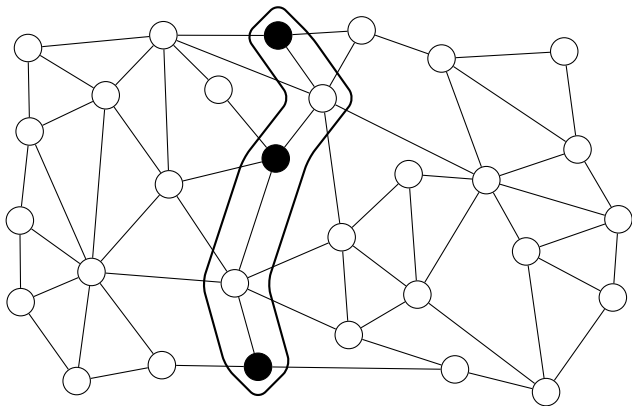
Many problems are solvable in  $2^{O(\sqrt{n})}$  in **planar graphs**, and unlikely solvable in  $2^{o(n)}$  in general graphs.

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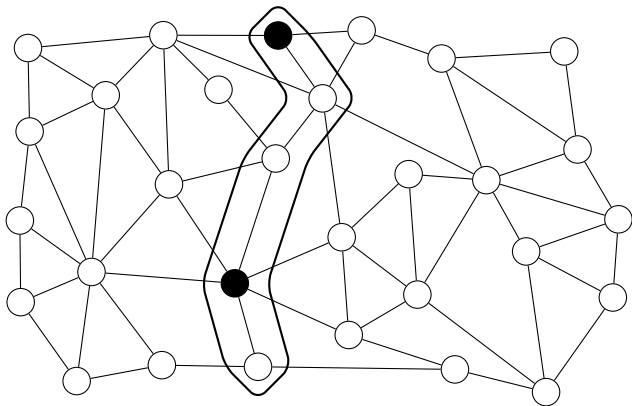
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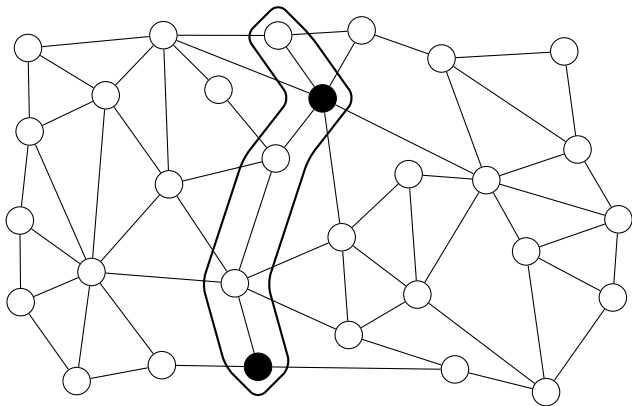
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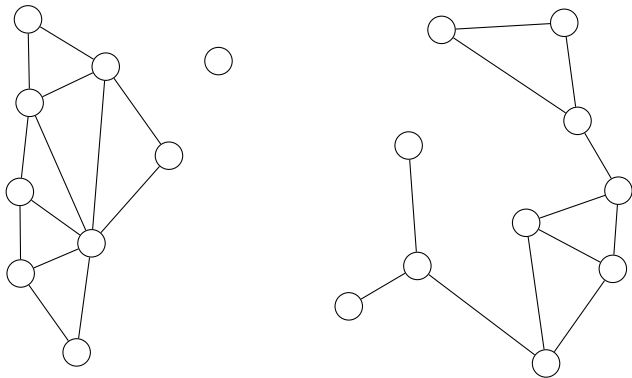
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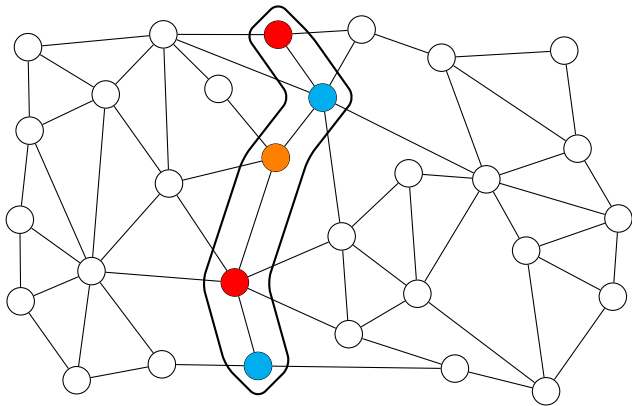


MAX INDEPENDENT SET, 3-COLORING, HAMILTONIAN PATH...

$$T(n) \leq 2^{O(\sqrt{n})} T(2n/3) \leq 2^{O(\sqrt{n} \log n)}$$



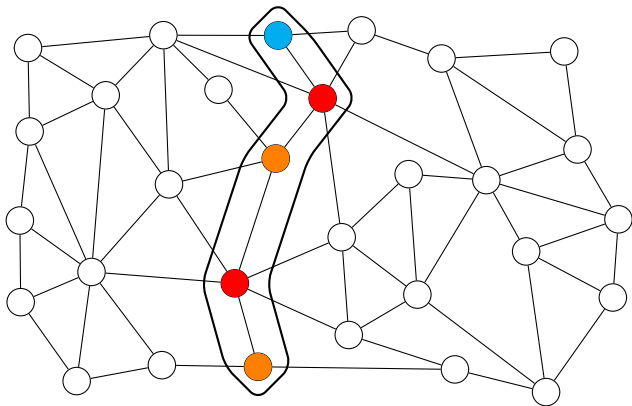
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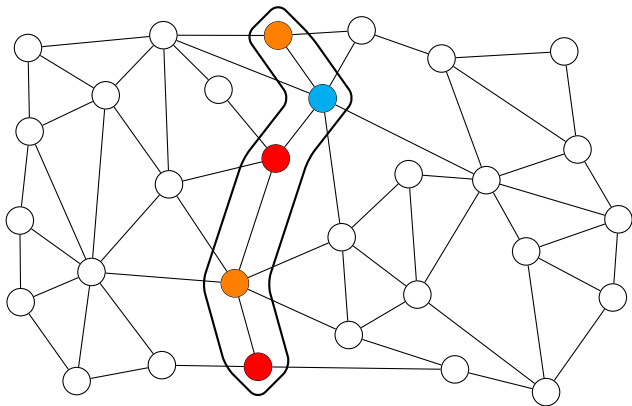
Dynamic programming would spare a  $\log n$  in the exponent.

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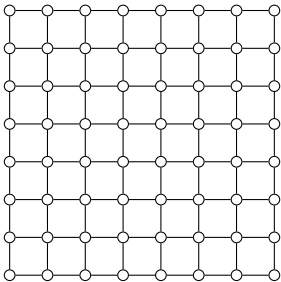


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# Bidimensionality

Theorem (Robertson & Seymour, Graph Minors)

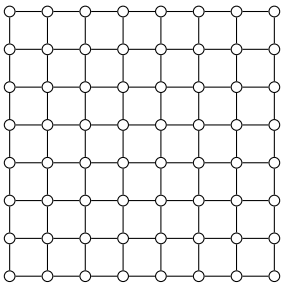
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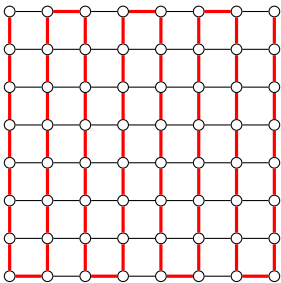


If  $tw < 5\sqrt{k} \rightsquigarrow$  algorithm in  $2^{O(tw)} n^{O(1)} = 2^{O(\sqrt{k})} n^{O(1)}$ .

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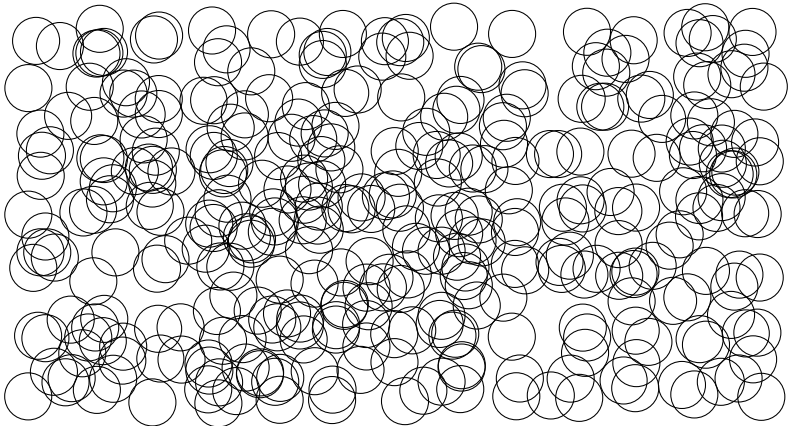
If  $\text{tw} < 5\sqrt{k} \rightsquigarrow$  algorithm in  $2^{O(\text{tw})} n^{O(1)} = 2^{O(\sqrt{k})} n^{O(1)}$ .

If  $\text{tw} \geq 5\sqrt{k} \rightsquigarrow \exists \sqrt{k} \times \sqrt{k}$ -grid minor  $\rightsquigarrow$  always yes (always no).

# Packing unit disks

Theorem (Alber & Fiala, J. Alg.'04)

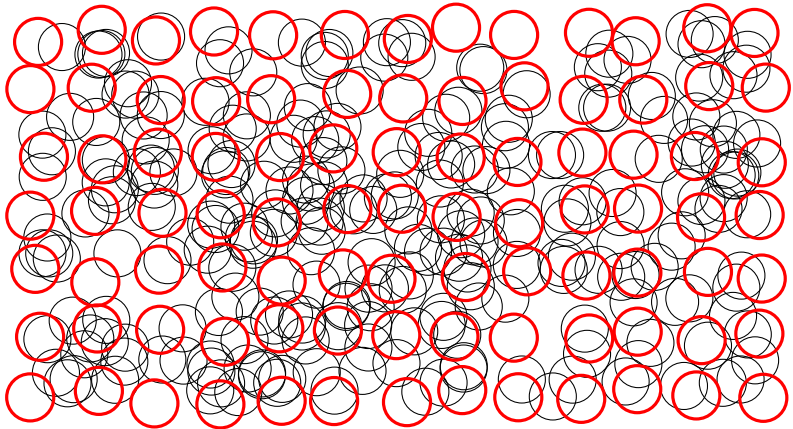
*Unit disks can be packed in time  $n^{O(\sqrt{k})}$ .*



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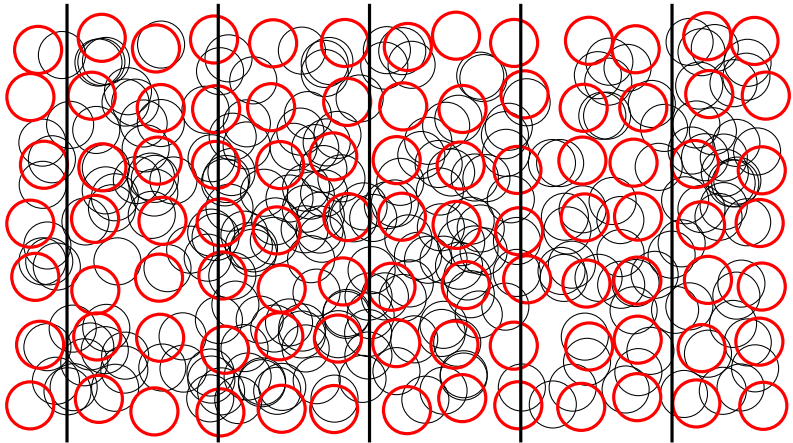
Imagine a solution.



# Packing unit disks

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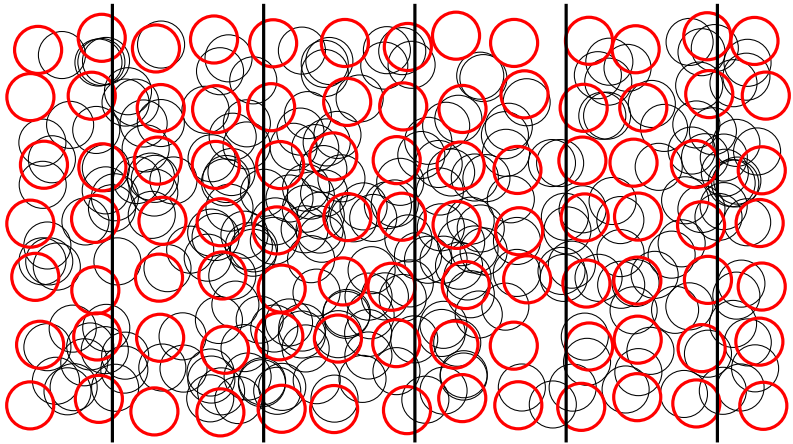


Translate by one unit  $\sqrt{k}$  vertical lines distant by  $\sqrt{k}$ .

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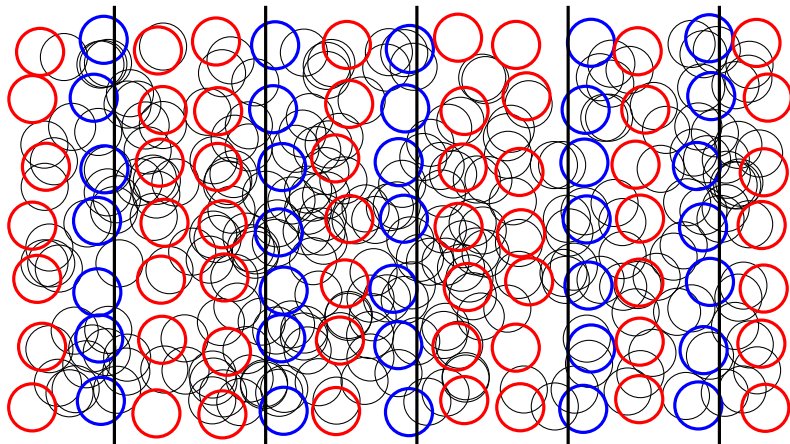


At some point, the lines intersect it on at most  $\sqrt{k}$  disks.

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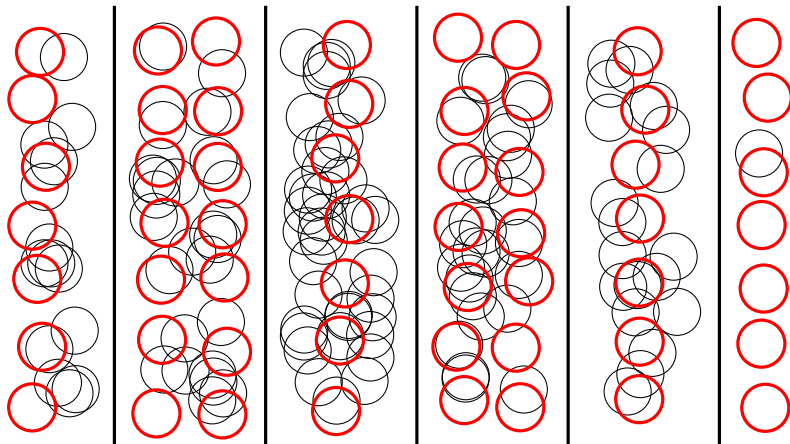


Guess that intersection in  $n^{\sqrt{k}}$ .

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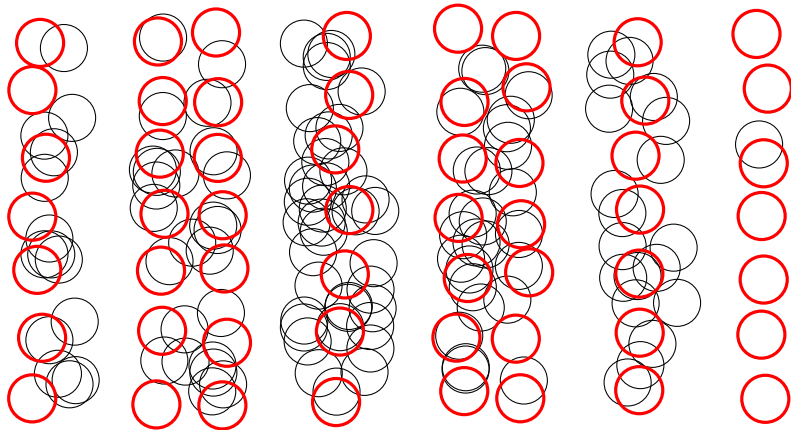


Remove the disks touched by the lines or this intersection.

## Packing unit disks

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*Unit disks can be packed in time  $n^{O(\sqrt{k})}$ .*



Those instances can be solved by DP in  $n^{O(\sqrt{k})}$  due to their width.

## Packing disks

Idea of Sarel Har-Peled to get geometric QPTAS:  
**use the Voronoi diagram of an assumptive solution.**

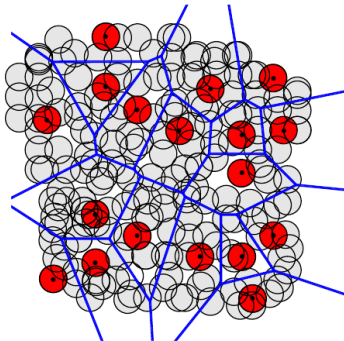
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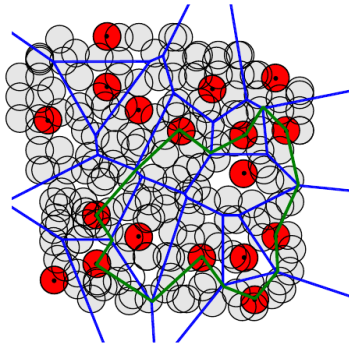


The Voronoi diagram of a solution is a planar graph with  $k$  faces.

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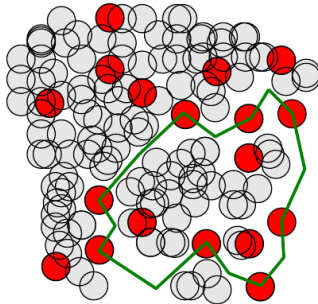
It has a  $O(\sqrt{k})$  face-balanced noose. Guess it in  $n^{O(\sqrt{k})}$ .



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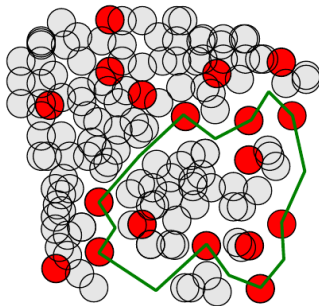


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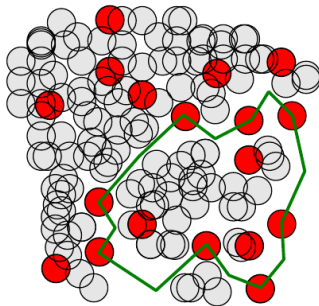


Recurse:  $T(n, k) \leq n^{O(\sqrt{k})} T(n, 2k/3) \leq n^{O(\sqrt{k})}$ .

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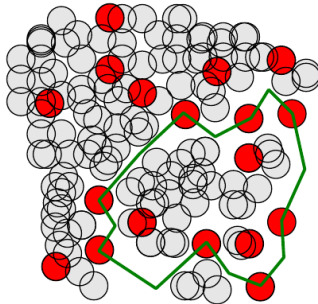


For non unit disks, use *distance*  $d(c, p) := \|c - p\|_2 - r(p)$ .

# Covering points with disks

Theorem (Marx & Pilipczuk, ESA '15)

*Selecting  $k$  objects among a set of disks covering a set of points can be solved in time  $n^{O(\sqrt{k})}$ .*



With more subtle rules to make the inside and outside independent.

## Essentially best algorithms: GRID TILING

Theorem (Chen et al., CCC '04)

$k$ -CLIQUE cannot be solved in time  $f(k)n^{o(k)}$  under ETH.

GRID TILING: Embed  $k$ -CLIQUE in a  $k$ -by- $k$  grid.

In each cell select one pair among a prescribed subset of  $[n] \times [n]$ .

Two horizontally (vertically) adjacent cells should agree on their first (second) coordinate.

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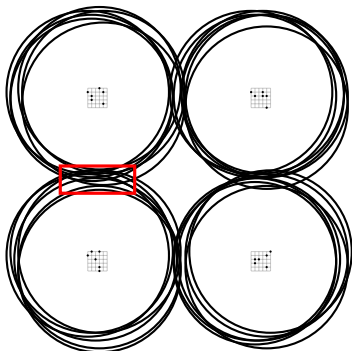
The choice of vertices are made along the diagonal:  $(u_i, u_i)$ .

Checking the edge  $u_i u_j$  is done in the cell  $(i, j)$ .

## Essentially best algorithms: GRID TILING

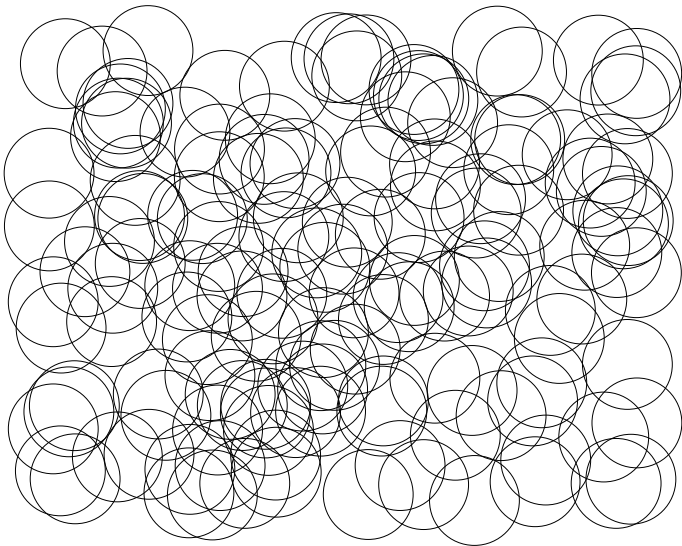
Theorem (Marx, ESA '05)

MIS on UDG cannot be solved in time  $f(k)n^{o(\sqrt{k})}$  under ETH.



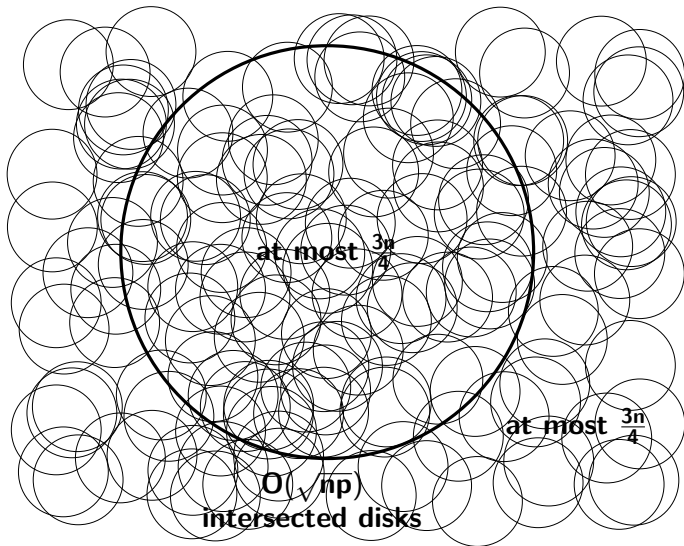
Syntactical reduction to MIS on UDG.

Smith and Wormald '98:  $\forall n$  disks with ply  $p$ ,





Smith and Wormald '98:  $\forall n$  disks with ply  $p$ ,  $\exists \mathbf{O}$



## Actually more general

### Theorem (Smith & Wormald, FOCS '98)

*For every  $d \geq 1$  and  $B \geq 0$ , there exists a constant  $c = c(d, B)$ , such that for every  $B$ -fat collection  $\mathcal{S}$  of  $n$   $d$ -dimensional convex sets with ply at most  $\ell$ , there exists a  $d$ -dimensional sphere  $Q$ , such that:*

*at most  $\frac{d+1}{d+2}n$  elements of  $\mathcal{S}$  are entirely inside  $Q$ ,*

*at most  $\frac{d+1}{d+2}n$  elements of  $\mathcal{S}$  are entirely outside  $Q$ ,*

*at most  $cn^{1-1/d}\ell^{1/d}$  elements of  $\mathcal{S}$  intersect  $Q$ .*

## Simple algorithm for $\ell$ -coloring disks

Win-win based on the value of the ply:

$p > \ell \rightsquigarrow$  answer NO.

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treewidth  $\tilde{O}(\sqrt{n\ell}) \rightsquigarrow$  coloring in time  $2^{\tilde{O}(\sqrt{n\ell})}$

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For  $\ell$ -coloring  $d$ -dimensional balls, the same argument gives running time  $2^{\tilde{O}(n^{1-1/d}\ell^{1/d})}$ .

## Essentially best algorithms: GRID COLORING

Theorem (Biro et al., SoCG '17)

*For any  $\alpha \in [0, 1]$ , coloring  $n$  unit disks with  $\ell = \Theta(n^\alpha)$  colors cannot be solved in time  $2^{o(n^{\frac{1+\alpha}{2}})} = 2^{o(\sqrt{n\ell})}$ , under the ETH.*

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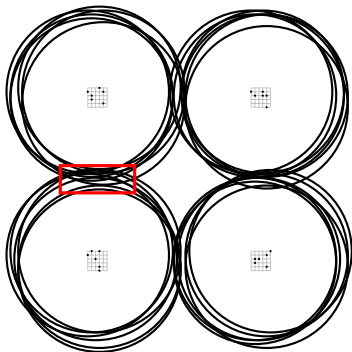
And everything in between (hard part).

For instance,  $\sqrt{n}$ -coloring cannot be done in  $2^{o(n^{3/4})}$ .



## Essentially best algorithms: GRID COLORING

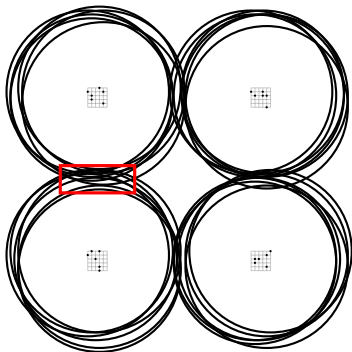
$k$ -by- $k$  GRID TILING instance with  $t$  legal pairs in each cell.



Instead of selecting one center in each small grid...

## Essentially best algorithms: GRID COLORING

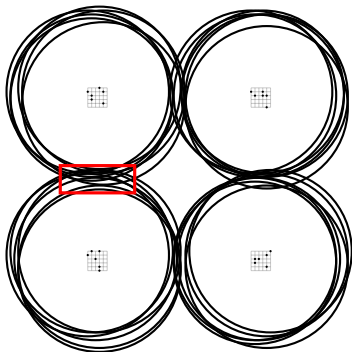
$k$ -by- $k$  GRID TILING instance with  $t$  legal pairs in each cell.



...we color them with a different color each...

## Essentially best algorithms: GRID COLORING

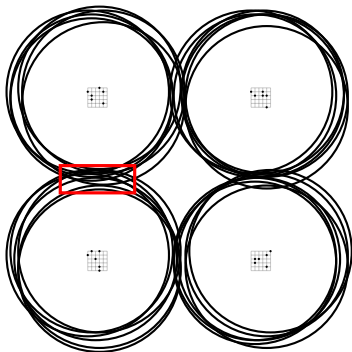
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...such that each color class corresponds to a clique  
GRID COLORING cannot be solved in time  $2^{o(tk)}$  under ETH.

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## Segment intersection graphs

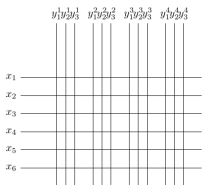
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## Segment intersection graphs

The subexponential algorithm generalizes to other **fat** objects.

**Theorem (Rzążewski)**

4-COLORING *on 2-DIR cannot be solved in time  $2^{o(n)}$ .*



No subexponential algorithms even for a constant number of colors.

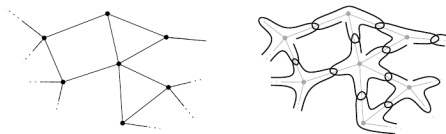
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3-COLORING on segments?

## 3-COLORING on segments?

Subexponential algorithm even on string graphs!

String graphs: intersection graphs of curves in the plane.



### Theorem

(LIST) 3-COLORING *on strings* can be solved in time  $2^{O(n^{2/3})}$ .



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Important fact: string graphs have separators of size  $O(\sqrt{m})$ .

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What about MIN DOMINATING SET? MIN INDEPENDENT DOMINATING SET? MAX CLIQUE?

## Subexponential algorithms on string graphs

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Win-win:

high maximum degree: good branching

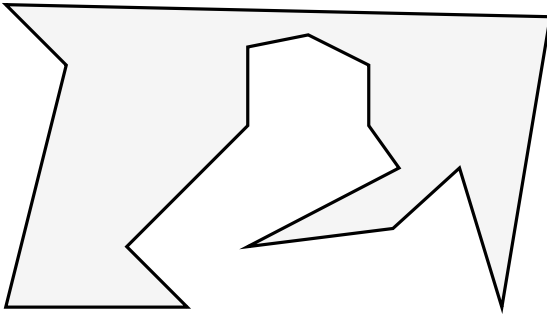
low maximum degree: small separator

Theorem (Fox & Pach, SODA '11)

MAX INDEPENDENT SET *has a subexponential algorithm on string graphs.*

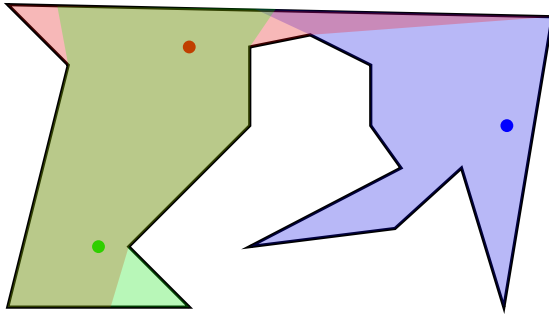
What about MIN DOMINATING SET? MIN INDEPENDENT DOMINATING SET? MAX CLIQUE? No, No, No

# Art Gallery Problem



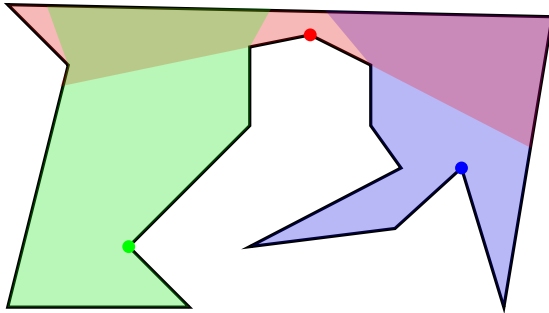
Simple polygon with  $n$  vertices.

# Art Gallery Problem



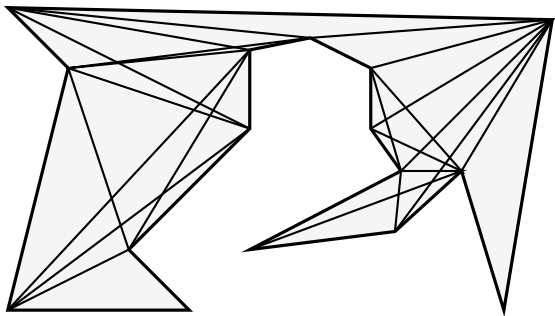
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Guard the gallery with  $k$  **points**.

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## Art Gallery Problem



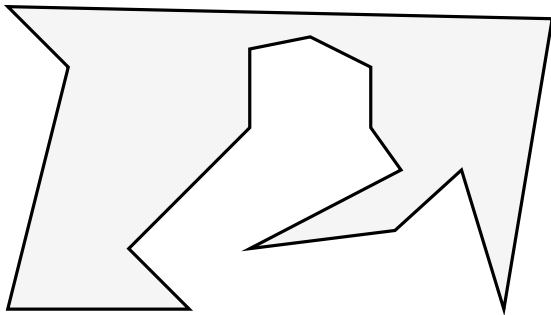
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**DOMINATING SET** in the visibility graph of a simple polygon.

Those three problems are NP-hard.



## Art Gallery Problem



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Algorithm in time  $f(k)n^{O(\sqrt{k})}$ ? Algorithm in time  $f(k)n^c$ ?

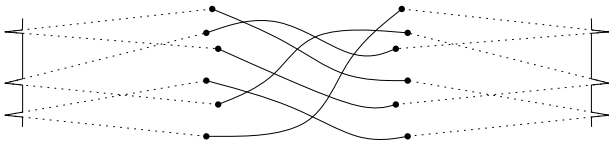
## Intermediate problem and linker

Theorem (B. & Miltzow, ESA '16)

No algorithm in time  $f(k)n^{o(k/\log k)}$  unless the ETH fails.

two instances of min hitting set of *intervals*

taking a point in instance A forces a specific point in instance B



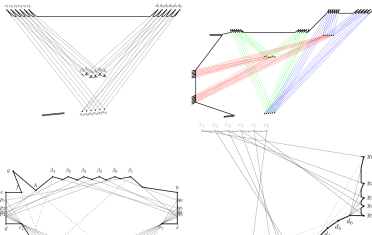
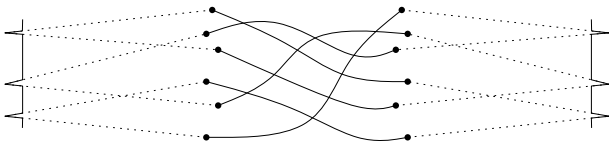
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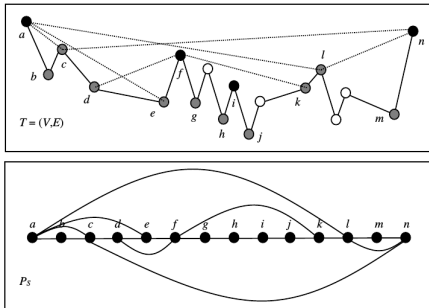


# Terrain Guarding

Guarding an  $x$ -monotone polygonal curve with  $k$  vertices.

Theorem (Ashok et al. SoCG'17)

TERRAIN GUARDING is solvable in  $n^{O(\sqrt{k})}$ , hence in  $2^{O(\sqrt{n} \log n)}$ .



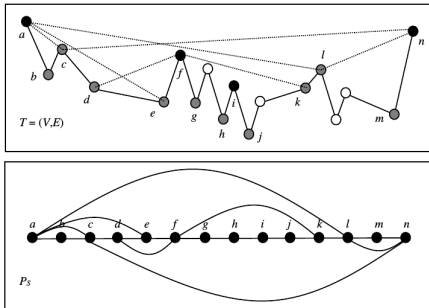
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A planar graph with domination number  $k$  has treewidth  $O(\sqrt{k})$ .  
Non-trivial divide-and-conquer based on this separator.

## Subexponential algorithms of geometric graphs

Algorithmic techniques: guessing a *small* separator relative to a hypothetical solution (Voronoi diagram, planar graph, etc.), separator theorems (for disk graph, string graphs; generalizing the planar separator theorem), win-win approach.

ETH-based lowerbounds: reductions from GRID TILING, GRID COLORING, 2-TRACK HITTING SET.

Separator-based techniques also lead to approximation algorithms: Instead of brute-forcing on the separator, ignore it.

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Some open questions:

Optimal complexity of MIS, 3-COLORING, on string graphs?

Lowerbound or better algorithm for TERRAIN GUARDING?

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**Thanks for your attention!**