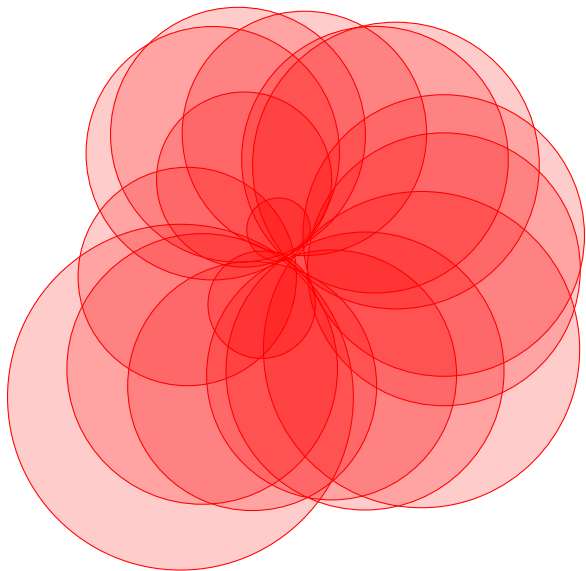


# QPTAS and Subexponential Algorithm for Maximum Clique on Disks

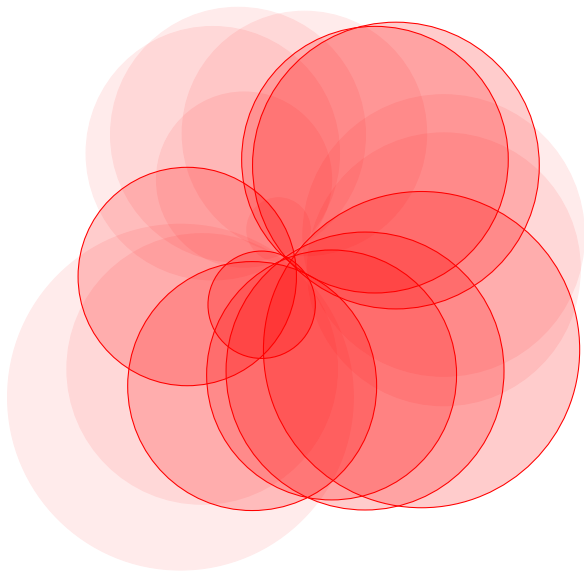
Édouard Bonnet, Panos Giannopoulos, Eun Jung Kim, Paweł  
Rzążewski, and Florian Sikora

LIP, ENS Lyon

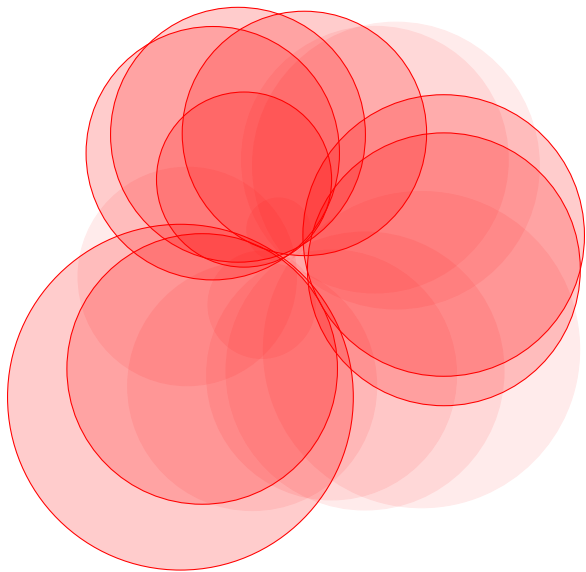
June 12th 2018, Budapest



Find a largest collection of disks that pairwise intersect

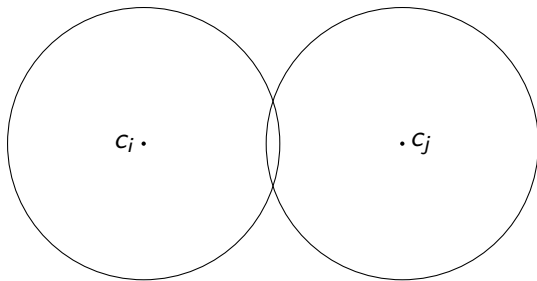


Like this



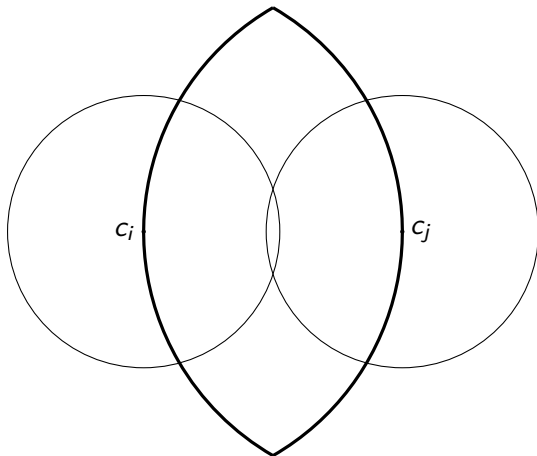
or that

Polynomial algorithm on unit disks by Clark, Colbourn, and Johnson, 1990.



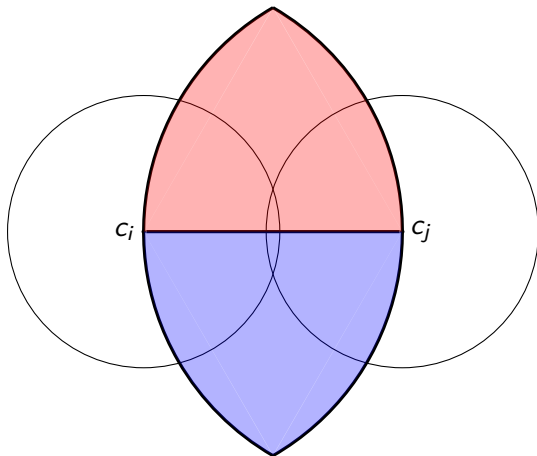
Guess two farthest disks in an optimum solution  $S$ .

Polynomial algorithm on unit disks by Clark, Colbourn, and Johnson, 1990.



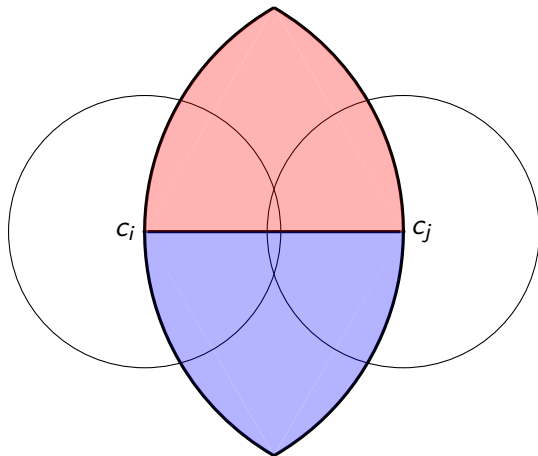
Hence, all the centers of  $S$  lie inside the bold digon.

Polynomial algorithm on unit disks by Clark, Colbourn, and Johnson, 1990.



Two disks centered in the same-color region intersect.

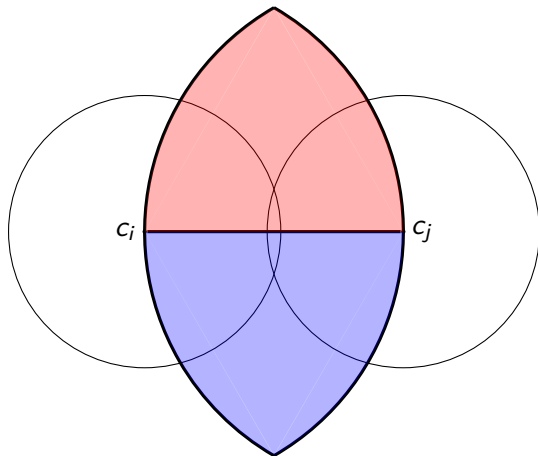
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We solve Max Clique in a co-bipartite graph.



Polynomial algorithm on unit disks by Clark, Colbourn, and Johnson, 1990.



We solve Max Independent Set in a bipartite graph.

# Disk graphs

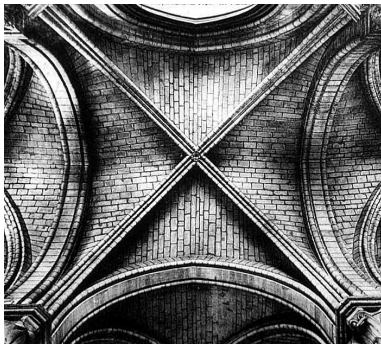
## Unweighted problems

3-Colourability [?]	NP-complete	<a href="#">[+]Details</a>
Clique [?]	Unknown to ISGCI	<a href="#">[+]Details</a>
Clique cover [?]	NP-complete	<a href="#">[+]Details</a>
Colourability [?]	NP-complete	<a href="#">[+]Details</a>
Domination [?]	NP-complete	<a href="#">[+]Details</a>
Feedback vertex set [?]	NP-complete	<a href="#">[+]Details</a>
Graph isomorphism [?]	Unknown to ISGCI	<a href="#">[+]Details</a>
Hamiltonian cycle [?]	NP-complete	<a href="#">[+]Details</a>
Hamiltonian path [?]	NP-complete	<a href="#">[+]Details</a>
<i>Independent dominating set</i> [?]	NP-complete	<a href="#">[+]Details</a>
Independent set [?]	NP-complete	<a href="#">[+]Details</a>
<i>Maximum bisection</i> [?]	NP-complete	<a href="#">[+]Details</a>
Maximum cut [?]	NP-complete	<a href="#">[+]Details</a>
<i>Minimum bisection</i> [?]	NP-complete	<a href="#">[+]Details</a>
Monopolarity [?]	NP-complete	<a href="#">[+]Details</a>
Polarity [?]	NP-complete	<a href="#">[+]Details</a>
Recognition [?]	NP-hard	<a href="#">[+]Details</a>

Inherits the NP-hardness of planar graphs.

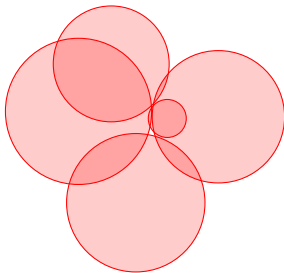
## So what is known for Max Clique on disk graphs?

- ▶ Polynomial-time 2-approximation
  - ▶ For any clique there are 4 points hitting all the disks.
  - ▶ Guess those points.
  - ▶ Solve exactly in each of the  $\binom{4}{2}$  co-bipartite graphs.
  - ▶ Output the best solution.
- ▶ No non-trivial exact algorithm known.



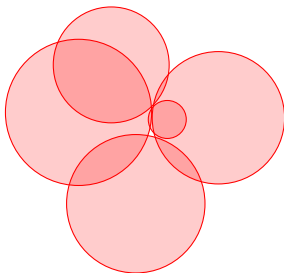
And what is known about disk graphs?

- ▶ Every planar graph is a disk graph.
- ▶ Every triangle-free disk graph is planar (centers  $\rightarrow$  vertices).
- ▶ So a triangle-free non-planar graph like  $K_{3,3}$  is not disk.
- ▶ A subdivision of a non-planar graph is not a disk graph (more generally not a string graph).
- ▶ ...



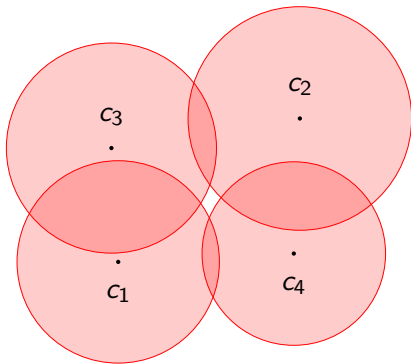
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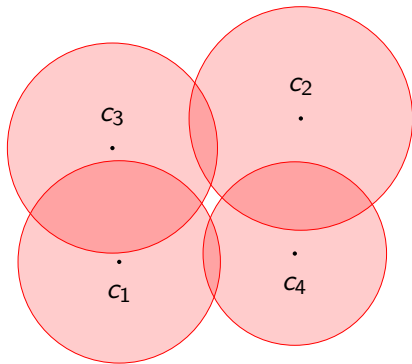


**Other ways of showing that a graph is not disk?**

Say the 4 centers encoding a  $K_{2,2} = \overline{2K_2}$  are in convex position.

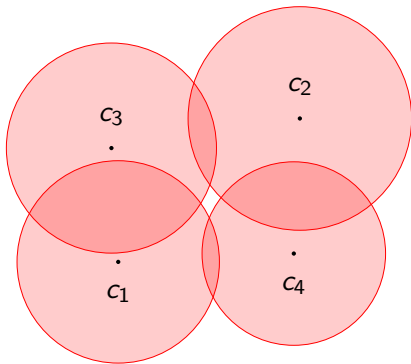


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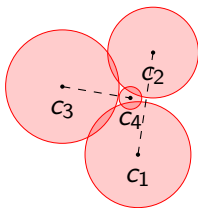
Suppose  $d(c_1, c_3) > r_1 + r_3$  and  $d(c_2, c_4) > r_2 + r_4$ .

But  $d(c_1, c_3) + d(c_2, c_4) \leq d(c_1, c_2) + d(c_3, c_4) \leq r_1 + r_2 + r_3 + r_4$ ,  
a contradiction.

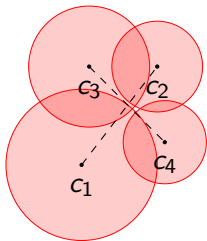


Conclusion: the 4 centers of an induced  $\overline{2K_2}$  are either

- ▶ not in convex position or
- ▶ in convex position with the non-edges being *diagonal*.

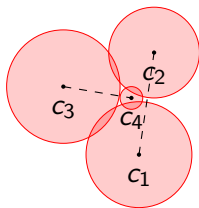


or

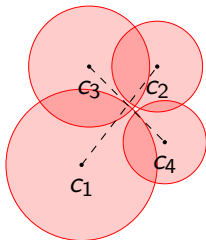


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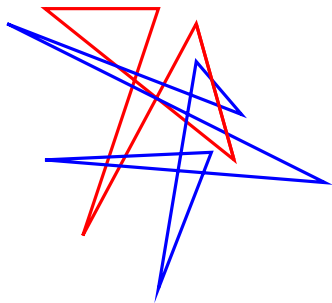


Reformulation: either

- ▶ the line  $\ell(c_1, c_2)$  crosses the segment  $c_3c_4$ , or
- ▶ the line  $\ell(c_3, c_4)$  crosses the segment  $c_1c_2$ , or
- ▶ both; equivalently, the segments  $c_1c_2$  and  $c_3c_4$  cross.

Assume  $\overline{C_s + C_t}$  is a disk graph.

Link consecutive centers of the two disjoint cycles (non-edges).

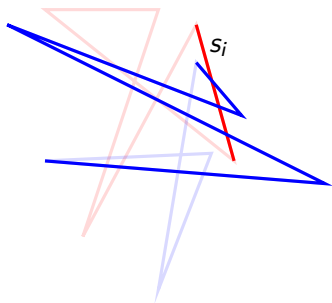


For each red segment  $s_i$ , we denote by:

- ▶  $a_i$  the number of blue segments crossed by  $\ell(s_i)$ .
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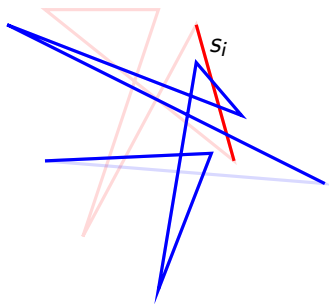


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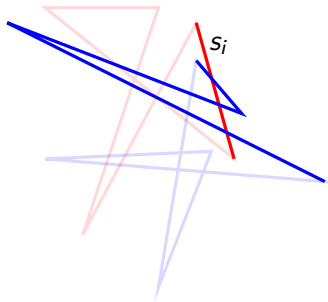


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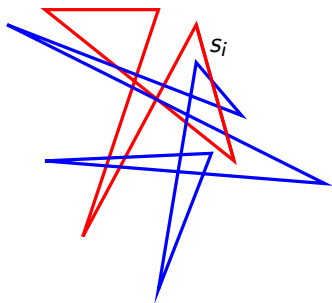


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It should be that  $a_i + b_i - c_i = t$ .

$$\sum_{1 \leq i \leq s} a_i + b_i - c_i = st$$

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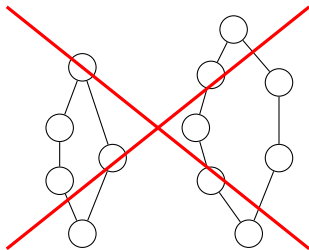
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**Hence  $s$  and  $t$  cannot be both odd.**

**The complement of two odd cycles is not a disk graph.**



## Going back to algorithms.

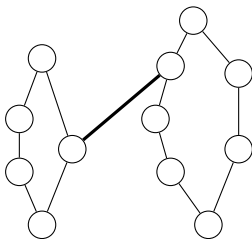
Can we solve Max Independent Set more efficiently if there are no two vertex-disjoint odd cycles as an induced subgraph?

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Another way to see it:

**at least one edge between two vertex-disjoint odd cycles**





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$\text{ocp}(G)$ : maximum size of an odd cycle packing.

Theorem (Bock et al. 2014)

*PTAS for Max Independent Set for  $\text{ocp} = o(n/\log n)$ .*

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Lemma

*Let  $H$  complement of a disk graph with  $n$  vertices.*

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Branching factor  $(1, n/\log^4 n)$  (in  $2^{\log^5 n}$ ), and PTAS otherwise.

## Subexponential algorithm

Theorem (Györi et al. 1997)

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$$2^{\tilde{O}(\min(n/\Delta, n/c, c\Delta))} \leq 2^{\tilde{O}(n^{2/3})} \text{ for } \Delta = c = n^{1/3}.$$



## Filled ellipses and triangles

2-subdivisions: graphs where each edge is subdivided exactly twice

co-2-subdivisions: complements of 2-subdivisions

### Theorem (technical)

*For some  $\alpha$ , Maximum Independent Set on 2-subdivisions is not  $\alpha$ -approximable algorithm in  $2^{n^{1-\epsilon}}$ , unless the ETH fails.*

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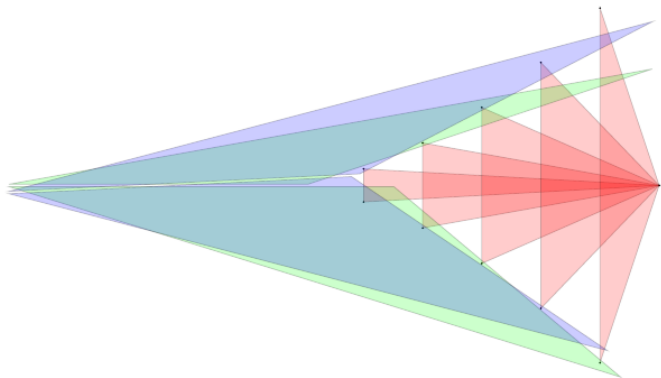
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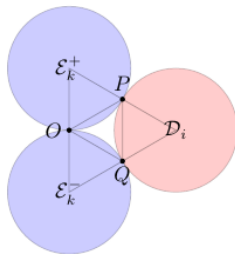
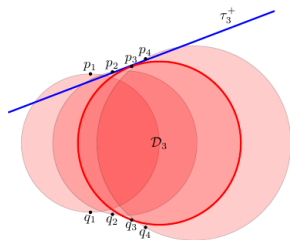
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**Graphs of filled ellipses or filled triangles contain all the co-2-subdivisions.**

## Filled triangles



## Filled ellipses



## Perspectives

- ▶ EPTAS for Max Clique on disk graphs and unit ball graphs (follow-up work with Bonamy, Bousquet, Charbit, and Thomassé)
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**Thank you for your attention!**