The Matching Problem in General Graphs is in QUASI-NC

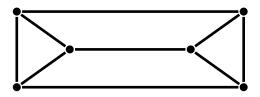
Jakub Tarnawski joint work with Ola Svensson



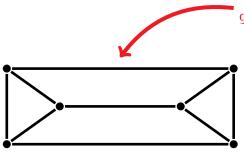


October 16, 2017

Given a graph, can we pair up all vertices using edges?

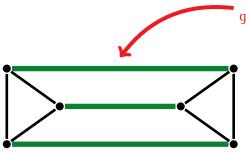


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Benchmark problem in computer science

Algorithms:

▶ bipartite: Jacobi [XIX century, weighted!]

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- since then, tons of research and still active
- many models of computation: monotone circuits, extended formulations, parallel, distributed, streaming/sublinear, ...



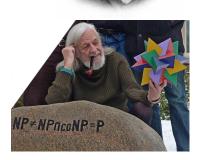
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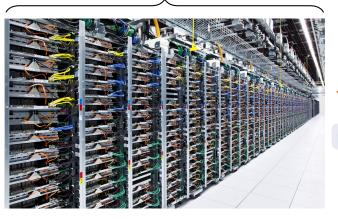
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Class \mathcal{NC} : problems that paralellize completely

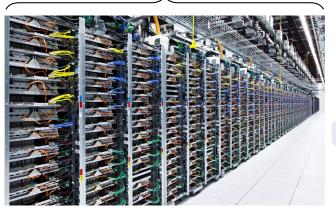
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- Matching is in RANDOMIZED \mathcal{NC} [Lovász 1979]: has randomized algorithm that uses:
 - polynomially many processors
 - polylog time
- ► Search version is in RANDOMIZED \mathcal{NC} :
 - ► [Karp, Upfal, Wigderson 1986]
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Can we derandomize all efficient computation?

Can we derandomize one of these algorithms?



Yes, for restricted graph classes:

- bipartite regular [Lev, Pippenger, Valiant 1981]
- bipartite convex [Dekel, Sahni 1984]
- incomparability graphs [Kozen, Vazirani, Vazirani 1985]
- ▶ bipartite graphs with small number of perfect matchings [Grigoriev, Karpinski 1987]
- claw-free [Chrobak, Naor, Novick 1989]
- K_{3,3}-free (decision version) [Vazirani 1989]
- planar bipartite [Miller, Naor 1989]
- dense [Dahlhaus, Hajnal, Karpinski 1993]
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- planar (search version) [Anari, Vazirani 2017]

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► Approach fails for non-bipartite graphs

Our result

We show: general matching is in QUASI- \mathcal{NC} :

- $ightharpoonup n^{poly \log n}$ processors
- ▶ poly log *n* time
- ▶ deterministic



Outline

Isolating weight functions [Mulmuley, Vazirani, Vazirani 1987]

② Bipartite case [Fenner, Gurjar, Thierauf 2015]

Difficulties of general case& our approach

Isolating weight functions [Mulmuley, Vazirani, Vazirani 1987]









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How to solve unweighted problem?



MAKE LIFE HARDER

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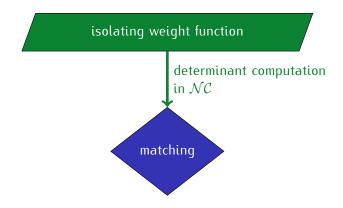


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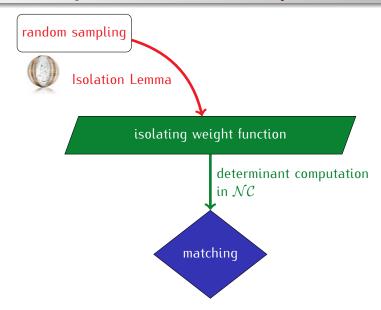
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Weight function $w: E \to \mathbb{Z}_+$ is **isolating** if there is a **unique** min-weight perfect matching

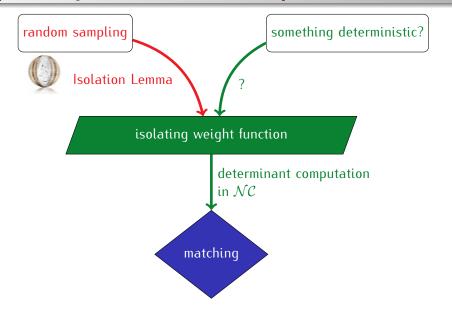
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- holds more generally, for any set family in place of matchings!
- many applications in complexity theory

Derandomize the Isolation Lemma

- ► Challenge: get an isolating weight function deterministically in NC
- ▶ We prove: can construct $n^{O(\log^2 n)}$ weight functions in QUASI-NC such that one of them is isolating
- ► We do it without looking at the graph
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2. Bipartite case [Fenner, Gurjar, Thierauf 2015]

Goal: how to construct $n^{O(\log n)}$ weight functions such that one of them is isolating?

Isolating matchings

What if w is **not** isolating?

► there are perfect matchings M, M' with w(M) = w(M') minimum

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If $\leq n^4$ cycles in the graph: done!

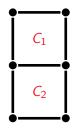
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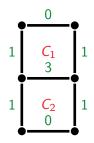
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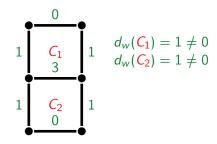
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Not so easy, but we can cope with all 4-cycles.

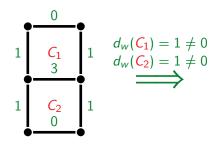






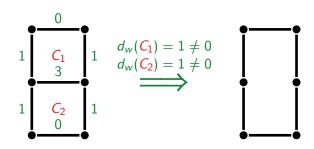
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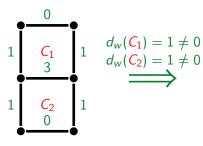


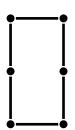
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Once we assign a cycle $\neq 0$ discrepancy, it will disappear from the active subgraph.



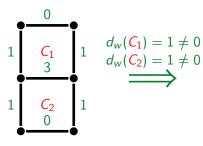


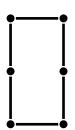
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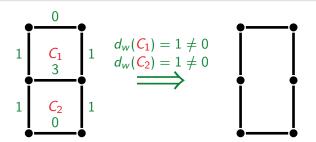


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By assigning $\neq 0$ discrepancy to 4-cycles, we can remove them. Then continue restricted to the smaller active subgraph!

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Actually, not sure how to find in \mathcal{NC} some w_i that is good... But always some w_i of a special form is good. Try all combinations $(w_1, w_2, ..., w_{\log n})$ obliviously! There are $n^{O(\log n)}$ many.

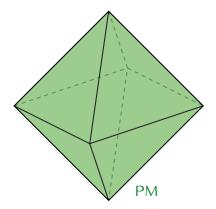
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Bipartite key property fails

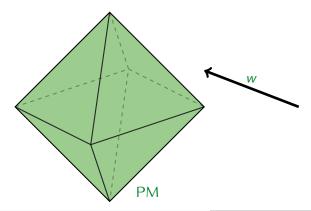
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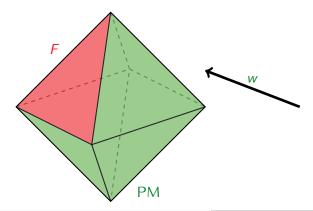
► PM: perfect matching polytope (convex hull of all perfect matchings)



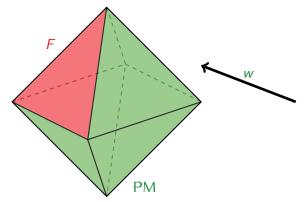
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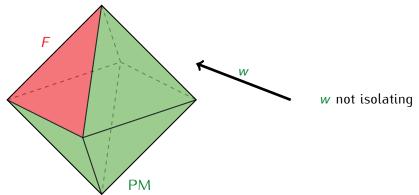
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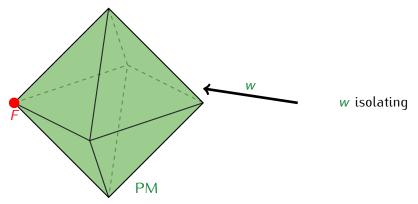
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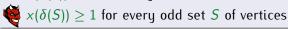


LP formulation

Edmonds [1965]

PM described as set of $x \in \mathbb{R}^E$ such that:

- $ightharpoonup x_e \ge 0$ for every edge e
- \triangleright $x(\delta(v)) = 1$ for every vertex v
- $(\delta(S) = \text{edges crossing } S)$





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 $(\delta(S)) \ge 1$ for every odd set S of vertices

So every face *F* is given as:

$$F = \{x \in PM : x_e = 0$$
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- In bipartite case:
 - $F = \{x \in PM : x_e = 0 \text{ for some edges } e\}$ (F given by the active subgraph)
- Now, faces are exponentially harder
- ▶ Need $2^{\Omega(n)}$ inequalities [Rothvoss 2013]



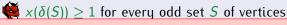
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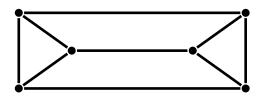
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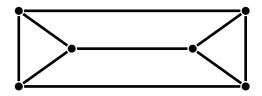


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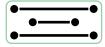


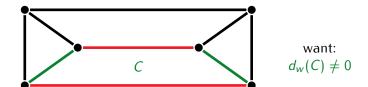
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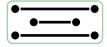


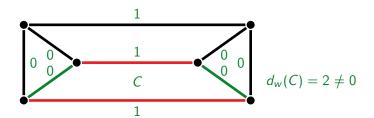
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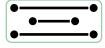


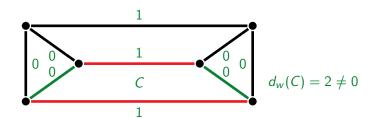
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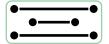


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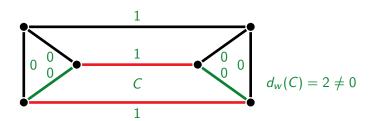


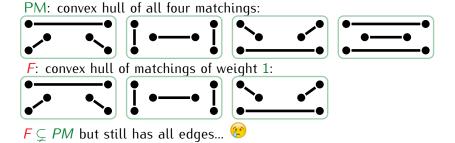
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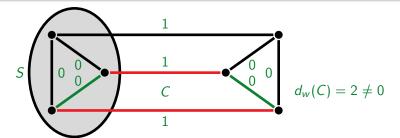












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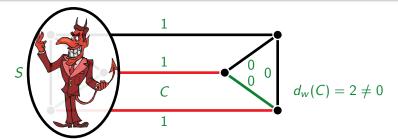






 $F \subseteq PM$ but still has all edges...

$$F = \{x \in PM : x(\delta(S)) = 1\}$$



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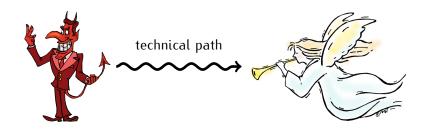
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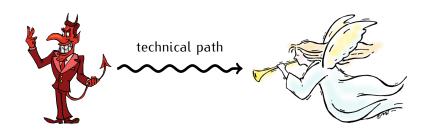
How we cope



How we cope



How we cope



Main ingredients:

- ► Laminar family of tight cut constraints
- ► Tight cut constraints decompose the instance
 - \Rightarrow divide-and-conquer approach

Laminarity

Every face F is given as:

$$F = \{x \in PM : x_e = 0$$
 for some edges e , $x(\delta(S)) = 1$ for some odd sets $S\}$

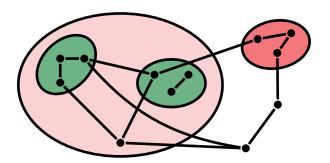
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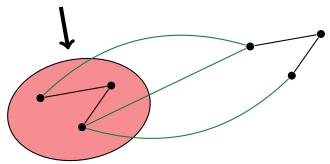
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Great news: "some" can be chosen to be a laminar family!

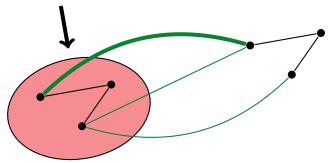
(at most n/2 constraints instead of exponentially many to describe a face)



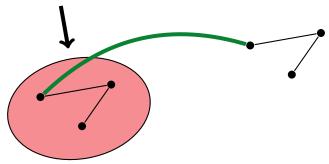
exactly one edge crossing



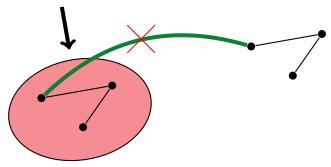
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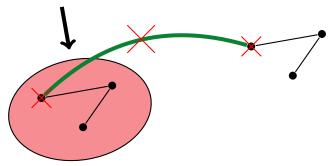
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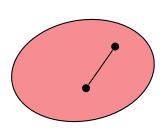


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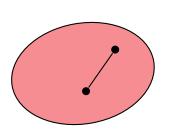


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- once we fix a boundary edge...
- ... the instance decomposes into two independent ones

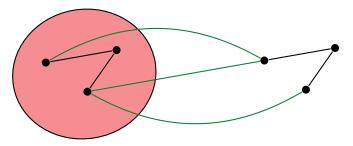




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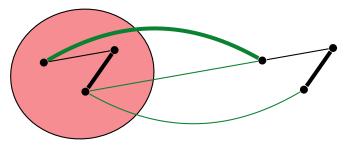
Simplest case of laminar family: only one tight odd set

Between friends: cycles that do not cross tight odd sets behave like in the bipartite case and can thus be removed



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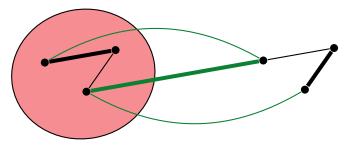
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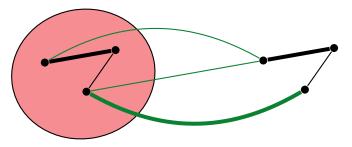
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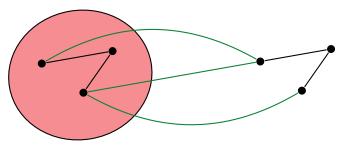
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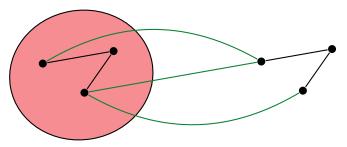
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Our dichotomy

Dichotomy:

- remove cycles not crossing tight odd-sets
- use tight odd-sets to decompose problem (divide & conquer)



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Details: see paper or talk to me:)

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 - even for bipartite graphs
 - √ for planar graphs: [Anari, Vazirani 2017]

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Thank you!