## Bipartite Perfect Matching is in quasi-NC

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Joint work with Rohit Gurjar and Thomas Thierauf (University of Aalen, Germany).
http://eccc.hpi-web.de/report/2015/177/.

## Matching

$G=(V, E)$ is a graph with $n$ nodes and $m$ edges.
Definition
A matching in $G$ is a set $M \subseteq E$ such that each $v \in V$ is incident to at most one $e \in M$.

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The search problem, SEARCH-PM, asks for a p.m. in a graph if it exists. Matchings and perfect matchings have been widely studied in combinatorics and complexity theory.

## Previous algorithms for PM and SеARCн-PM

- A polynomial-time algorithm for PM due to Edmonds [Edm65].
- A fast randomized parallel (RNC) algorithm for PM due to Lovász [Lov79] (also Chari, Rohatgi, \& Srinivasan [CRS95]). - An RNC algorithm for SEARCH-PM due to Karp, Upfal, \& Wigderson [KUW86].


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- K K,3-free graphs(Vazirani [Vaz89]), That is, PM and SEARCH-PM on bipartite graphs have uniform circuits random bits.


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That is, PM and SEARCH-PM on bipartite graphs have uniform circuits of depth $O\left(\log ^{2} n\right)$ and size $2^{O\left(\log ^{2} n\right)}$.
We also give an $\mathrm{RNC}^{2}$ algorithm for bipartite PM using $O\left(\log ^{2} n\right)$ random bits.

## Bipartite perfect matching in RNC

## $G$ bipartite with bipartition $L=\left\{u_{1}, \ldots, u_{n / 2}\right\}$ and $R=\left\{v_{1}, \ldots, v_{n / 2}\right\}$.

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\operatorname{det}\left(A_{w}\right)=\sum_{M \text { a p.m. of } G} \operatorname{sgn}(M) 2^{w(M)} .
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If $G$ has no p.m., then $\operatorname{det}\left(A_{w}\right)=0$ for any $w$. If $G$ does have a p.m., then $\operatorname{det}\left(A_{w}\right)$ may still be 0 because of cancellations.

## Definition

A weight function $w$ is isolating if $G$ has a unique minimum weight p.m. with respect to $w$.

If $w$ is isolating, then $\operatorname{det}\left(A_{w}\right) \neq 0$, because the minimum weight term in $\operatorname{det}\left(A_{w}\right)$ does not cancel with other terms, which are strictly higher powers of 2 .

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## Lemma (Isolation Lemma [MVV87])

Let $w(e)$ chosen uniformly at random from $\{1, \ldots, 2 m\}$ for each edge $e$ independently. Then $w$ is isolating with probability $\geq 1 / 2$.

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If $w$ is isolating, then computing $\operatorname{det}\left(A_{w}\right)$ gives the correct answer. This can be done in $\mathrm{NC}^{2}$ (Berkowitz [Ber84]).

## We want to derandomize this lemma!

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\text { Let } E=\left\{e_{0}, \ldots, e_{m-1}\right\} \text {, and define } w\left(e_{i}\right)=2^{i} \text { for all } i<m \text {. }
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## Lemma ([CRS95])

Let $s$ be a positive integer, and let $t=n^{2} s$. Then for any set of $s$ many cycles $\left\{C_{1}, \ldots, C_{s}\right\}$ there exists a weight function $w \in W_{t}$ that gives nonzero circulation to all of $C_{1}, \ldots, C_{s}$.

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We will apply this lemma with $s:=n^{4}$.
only $6 \log n$ bits.

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## Lemma ([CRS95])

Let $s$ be a positive integer, and let $t=n^{2} s$. Then for any set of $s$ many cycles $\left\{C_{1}, \ldots, C_{s}\right\}$ there exists a weight function $w \in W_{t}$ that gives nonzero circulation to all of $C_{1}, \ldots, C_{s}$.

We will apply this lemma with $s:=n^{4}$.
Each weight of $w$ is taken modulo some $j \leq t=n^{2} s=n^{6}$, so needs only $6 \log n$ bits.

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Corollary
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- such that the distance between adjacent vertices is $\leq r / 2$.
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## An isolating weight function for $G$

## We must glue the weight functions $w_{1}, \ldots, w_{k}$ together into a single

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## Lemma

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## Proof

> - Notice that the edge sets of the $G_{i}$ form a descending chain, ending in a p.m. $M$ of $G$ (the edge set of $G_{k}$ ).
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## Proving the Key Lemma: The perfect matching polytope

Let $\mathbb{R}^{E}$ be the $m$-dimensional real vector space with standard basis labeled by the edges of $G$.
Then any set $S \subseteq E$ of edges naturally corresponds to its characteristic vector $\left(s_{e}\right)_{e \in E}$, where, for each edge $e \in E$,


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## Lemma ([LP86])

If $G$ is bipartite, then a vector $\vec{x}=\left(x_{e}\right)_{e}$ is in $\mathrm{PM}(G)$ if and only if

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x_{e} & \geq 0, \\
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for all $e \in E$ and $v \in V$, where $\delta(v)$ is the set of edges incident to $v$.

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## Key Lemma (cont.)

Let $\vec{x}_{1}, \ldots, \vec{x}_{t} \in \mathrm{PM}(G)$ be vectors corresponding to all the p.m.'s of $G$ with the same minimum weight $q$.

## Key Lemma (cont.)

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\vec{x}=\left(x_{e}\right)_{e}=\frac{\vec{x}_{1}+\cdots+\vec{x}_{t}}{t}
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Then $\vec{x} \in P M(M)$, and $w(\vec{x})=q$.
Also, every entry of $\vec{x}$ in the derived graph $G^{\prime}$ satisfies $x_{e} \geq \frac{1}{t}$.

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## The RNC algorithm

## Recall $w \bmod j\left(e_{i}\right)=2^{i} \bmod j$ for each edge $e_{i} \in E$ and $2 \leq j \leq t$. Instead of trying all of these weight functions, we let $j$ be a random

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Any set of $s$ many cycles has nonzero circulation with high probability Doing this $k$ times gives random $w_{1}, \ldots, w_{k}$.

## Other results

The following are all in quasi-NC:

- bipartite weighted PM with quasi-polynomially bounded integer weights
- maximum bipartite matching
- cycle cover with polynomially bounded integer weights
- subtree isomorphism
- max flow with polynomially bounded integer capacities
- constructing a depth-first search tree


## Acknowledgments

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