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/.

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 $e \in M$.

For a perfect matching (p.m.): substitute "exactly" for "at most" above. The perfect matching decision problem, PM, asks whether a given graph has a p.m.

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.

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- Another RNC algorithm due to Mulmuley, Vazirani, & Vazirani [MVV87] using the Isolation Lemma.
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- graphs having polynomially many p.m.'s (Grigoriev & Karpinski [GK87], also Agrawal, Hoang, & Thierauf [AHT07])
- bipartite *d*-regular graphs (Lev, Pippenger, & Valiant [LPV81], also Sharan & Wigderson [SW96])
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We also give an RNC^2 algorithm for bipartite PM using $O(\log^2 n)$ random bits.

G bipartite with bipartition $L = \{u_1, \ldots, u_{n/2}\}$ and $R = \{v_1, \ldots, v_{n/2}\}$. Given a weight function $w : E \to \mathbb{Z}^+$, we extend *w* to sets of edges: for $S \subseteq E$, define $w(S) := \sum_{e \in S} w(e)$. Define the $n/2 \times n/2$ matrix $A_w = [a_{i,i}]$ as

$$a_{ij} = \begin{cases} 2^{w(e)} & \text{if } e = (u_i, v_j) \in E, \\ 0 & \text{if } (u_i, v_j) \notin E. \end{cases}$$

Then

$$\det(A_w) = \sum_{M ext{ a p.m. of } G} \operatorname{sgn}(M) 2^{w(M)}$$
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If G has no p.m., then $det(A_w) = 0$ for any w.

If G does have a p.m., then $det(A_w)$ may still be 0 because of cancellations.

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$$\det(A_w) = \sum_{M \text{ a p.m. of } G} \operatorname{sgn}(M) \, 2^{w(M)}$$

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

If *w* is isolating, then det(A_w) \neq 0, because the minimum weight term in det(A_w) does not cancel with other terms, which are strictly higher powers of 2.

Lemma (Isolation Lemma [MVV87])

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

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We want to derandomize this lemma!

Let $E = \{e_0, \ldots, e_{m-1}\}$, and define $w(e_i) = 2^i$ for all i < m. *w* is clearly isolating, ...

but we cannot compute $det(A_w)$ efficiently, because the matrix entries are too big.

Instead, we reduce the weights modulo small numbers *j*:

Definition

Fix an integer j > 1. Define the weight function w_{mod} as

 $w_{\mathrm{mod}\,j}(e) := w(e) \,\mathrm{mod}\,j$

for all $e \in E$.

For some t we choose later, define the set of weight functions

$$W_t := \{w_{\text{mod } j} \mid 2 \le j \le t\} \ .$$

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Let $C = \langle e_1, \dots, e_p \rangle$ be a cycle of *G* with edges given in cyclic order. (*p* is even because *G* is bipartite.)

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Given a weight function w, the circulation of C with respect to w is

$$c_w(C) := \left|\sum_{i=1}^p (-1)^i w(e_i)
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$$c_w(C) := \left|\sum_{i=1}^p (-1)^i w(e_i)\right|$$



We would like to choose a weight function from W_t that gives nonzero circulation to as many cycles as possible. We cannot do this for all cycles at once, so we work in stages, starting

with short cycles.

Lemma ([CRS95])

Let s be a positive integer, and let $t = n^2 s$. Then for any set of s many cycles $\{C_1, \ldots, C_s\}$ 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 $s := n^4$.

Each weight of *w* is taken modulo some $j \le t = n^2 s = n^6$, so needs only 6 log *n* bits.

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Suppose G has a p.m., and w is a weight function on G.

Definition

The derived graph of G with respect to w is the subgraph $G^{(w)} := (V, E')$, where E' is the union of all w-min weight p.m.'s of G.

Key Lemma

All cycles in $G^{(w)}$ have zero circulation with respect to w.

We proved this lemma using linear algebra. Later, an alternate combinatorial proof was found by Rao, Shpilka, & Wigderson (reported in Goldwasser & Grossman [GG15]).

Corollary All p.m.'s in G^(w) are min weight p.m.'s of G.

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Corollary

In steps, we remove cycles from derived graphs whose lengths are increasing powers of 2.

The next lemma says there are not too many of these.

Lemma

Let G be a graph with no cycles of length \leq r for some even r. Then G has \leq n⁴ cycles of length \leq 2r.

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 Given a cycle C of length ≤ 2r, choose four vertices u₀, u₁, u₂, u₃ on the cycle

• such that the distance between adjacent vertices is $\leq r/2$.

- This is the only such cycle given (*u*₀,..., *u*₃). If there is another such cycle *C*', then
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The sequence of derived graphs

Start with $G_0 := G$, a bipartite graph with a p.m.

- Choose w₁ ∈ W_t such that all cycles in G₀ of length ≤ 4 have nonzero circulation.
- Let $G_1 := G^{(w_1)}$. G_1 has a p.m. and no cycles of length ≤ 4 .
- Choose w₂ ∈ W_t such that all cycles in G₁ of length ≤ 8 have nonzero circulation.
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- Choose w_i ∈ W_i such that all cycles in G_{i-1} of length ≤ 2ⁱ⁺¹ have nonzero circulation.
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We must glue the weight functions w_1, \ldots, w_k together into a single weight function.

Let *B* be a strict bound on any edge weight from w_1, \ldots, w_k (we may take $B := n^6$).

For every $e \in E$, define

$$w(e) = B^{k-1}w_1(e) + B^{k-2}w_2(e) + \dots + B^0w_k(e)$$
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Lemma

- 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).
- Let $M' \neq M$ be some other p.m. of *G*.
- There must be some stage i < k where M and M' are both in G_i but M' is not in G_{i+1}.
- Since M and M' are in G₁,..., G_i, they both have the same minimum weight with respect to w₁,..., w_i.
- But since M' is not in G_{i+1} (but M is), it must be that w_{i+1}(M') > w_{i+1}(M).
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We do not know which w_1, \ldots, w_k work, so we try them all in parallel. For all $w_1, \ldots, w_k \in W_{n^6}$ in parallel:

- Compute *w* as above. (One of these choices of *w* must be isolating.)
- Compute det (A_w) as in the RNC algorithm of [MVV87].
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We do not know which w_1, \ldots, w_k work, so we try them all in parallel. For all $w_1, \ldots, w_k \in W_{n^6}$ in parallel:

- Compute *w* as above. (One of these choices of *w* must be isolating.)
- Compute $det(A_w)$ as in the RNC algorithm of [MVV87].
- If we ever find a nonzero determinant, answer "yes."
- Else, answer "no."

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 $(s_e)_{e \in E}$, where, for each edge $e \in E$,

$$s_e = \left\{ egin{array}{cc} 1 & ext{if } e \in S, \\ 0 & ext{if } e \notin S. \end{array}
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Lemma ([LP86])

If G is bipartite, then a vector $\vec{x} = (x_e)_e$ is in PM(G) if and only if

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for all $e \in E$ and $v \in V$, where $\delta(v)$ is the set of edges incident to v.

The \Rightarrow direction is clear for any graph (not necessarily bipartite). The converse does not hold for general graphs. We can extend any weight function w to \mathbb{R}^m by linearity:

$$w(\vec{x}) = \sum_{e \in E} w(e) x_e$$
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Key Lemma (cont.)

Let $\vec{x}_1, \ldots, \vec{x}_t \in \mathsf{PM}(G)$ be vectors corresponding to all the p.m.'s of *G* with the same minimum weight *q*.

$$\vec{x} = (x_e)_e = \frac{\vec{x}_1 + \dots + \vec{x}_t}{t}$$

Then $\vec{x} \in \mathsf{PM}(M)$, and $w(\vec{x}) = q$. Also, every entry of \vec{x} in the derived graph G' satisfies $x_e \ge \frac{1}{t}$.

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• Suppose some cycle *C* in the derived graph *G'* has nonzero circulation. W.I.o.g., the blue edges outweigh the red edges.

• Let $\vec{y} = (y_e)_e$ be the vector obtained from \vec{x} by subtracting $\frac{1}{t}$ from the blue edges and adding $\frac{1}{t}$ to the red edges.

• Then $\vec{y} \in \mathsf{PM}(G)$. Moreover,

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The RNC algorithm

Recall $w_{\text{mod } j}(e_i) = 2^i \mod j$ for each edge $e_i \in E$ and $2 \le j \le t$. Instead of trying all of these weight functions, we let j be a random prime.

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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

I would like to thank Ran Raz and the rest of the IAS faculty for inviting me to give this talk.

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