# Nearly Optimal Communication and Query Complexity of Bipartite Matching 

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Joint work with: Jan van den Brand, Yuval Efron, Danupon Nanongkai, and Sagnik Mukhopadhyay.

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## Biparite Matching

Given: Graph $G=(L \cup R, E)$ with $|L|=|R|=n,|E|=m$
Goal: Find a maximum matching $M \subseteq E$ of $G$


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Solve (sequentially) in:

- $\tilde{O}(m+n \sqrt{n})$ [vdBLNPSSSW'20]
- $O\left(m^{1+o(1)}\right)$ [CKLPGS'22]


Two-Party Communication Model

$E_{A}$
Bob

$E_{B}$

## Two-Party Communication Model


$E_{A}$

$E=E_{A} \cup E_{B}$

Bob

$E_{B}$

Goal: Solve matching on the union of their graphs

## Two-Party Communication Model



Goal: Solve matching on the union of their graphs

## Two-Party Communication Model



Bob
Send messages


Goal: Solve matching on the union of their graphs With as few bits of communication!

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Note: Do not care about internal running time

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Sending an edge: $O(\log n)$ bits


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Alice sends all her edges to Bob:

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- Sequential: $O(m \sqrt{n})$ running time
- Communication: $O(n \sqrt{n} \log n)$ bits



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Idea: BFS / DFS need only $O(n \log n)$ bits of communication
Converting $O\left(m^{1+o(1)}\right)$ sequential $\longrightarrow O\left(n^{1+o(1)}\right)$ communication seems difficult

Lower Bounds


## Lower Bounds

If Bob needs to output the matching: $\Omega(n \log n)$ bits lower bound


## Lower Bounds



## Theorem: [HMT'88]

$\Omega(n \log n)$ bits are needed to output the size of the maximum matching
$\uparrow$ only deterministic
$\Omega(n)$ randomized

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## Main Result:

One can solve bipartite matching in $O\left(n \log ^{2} n\right)$ bits of communication.
${ }^{\dagger}$ [Hajnal, Maass, Turan STOC'88];[Ivanyos, Klauck, Lee, Santha, de Wolf FSTTCS'12]; [Dobzinski,
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# $\Omega(n \log n)$ <br> $O(n \sqrt{n} \log n)$ <br> <br> Major Question ${ }^{\dagger}$ : What is the Communication <br> <br> Major Question ${ }^{\dagger}$ : What is the Communication Complexity of Bipartite Matching? 

 Complexity of Bipartite Matching?}

## Main Result:

One can solve bipartite matching in $O\left(n \log ^{2} n\right)$ bits of communication.

## Highlights:

- Follow from simple applications of known techniques (cutting planes method)
- Very slow runtime, but efficient communication
- Only "finds" $O(n \log n)$ edges
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(S \subseteq L \times R)
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- Query access:
- Edge-Query: "Is $(u, v) \in E$ ?"
- OR-Query: "Is $|S \cap E| \geq 1$ ?"

■ XOR-Query: "Is $|S \cap E|$ odd?"

- AND-Query: "Is $|S \cap E|=|S|$ "
"YES"
"NO"
"NO"


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Deterministic:
$\Theta\left(n^{2}\right)$
$\tilde{\Omega}(n), \tilde{O}(n \sqrt{n})$
$\Theta\left(n^{2}\right)$
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-

Randomized:

$$
\begin{gathered}
\Theta\left(n^{2}\right) \\
\Omega(n), \tilde{O}(n \sqrt{n}) \\
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\Omega(n), O\left(n^{2}\right) \\
\tilde{\Omega}(n \sqrt{n}), \tilde{O}\left(n^{7 / 4}\right)
\end{gathered}
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[Yao'88], [Zha'04], [DHHM'06], [IKLSdW'12], [LL'15], [BN'15], [Nis'15], [DNO'19], [Ben'22]

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\Theta\left(n^{2}\right) \\
\tilde{\Theta}(n \sqrt{n})
\end{gathered}
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Green: new tight upper-bound! Red: new tight lower-bound!
[Yao'88], [Zha'04], [DHHM'06], [IKLSdW'12], [LL'15], [BN'15], [Nis'15], [DNO'19], [Ben'22]

## The Algorithms

## Our Algorithms

Key Idea: Apply Cutting Planes Method to the Dual Vertex Cover LP.
Think "Ellipsoid Method"

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## Our Algorithms

Key Idea: Apply Cutting Planes Method to the Dual Vertex Cover LP.
Think "Ellipsoid Method"

- [Vempala, Wang, Woodruff SODA'20]: Solving general LPs in Communication Model with Cutting Planes: $\tilde{O}$ (dimension ${ }^{3}$ •\#bits per constraint) communication
- Crucial properties of Dual Vertex Cover LP:
- Low dimension ( $n$ instead of $m$ )
- Constraints are "short" (low support = cheap to send)
- Volume is small
- ... but not too small


## Dual: Minimum Vertex Cover

Given: Graph $G=(L \cup R, E)$ with $|L|=|R|=n,|E|=m$
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|max-matching| $=\mid$ min-vertex cover $\mid$ (in bipartite graphs!)


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Def: Fractional vertex cover $x$ :
$x_{u}+x_{v} \geq 1$ for all edges ( $u, v$ )


## Dual Linear Program: Minimum Vertex Cover

$$
\begin{array}{ll}
\min & \sum_{v \in V} x_{v} \\
\text { s.t. } & x_{v}+x_{u} \geq 1 \quad \forall(u, v) \in E \\
& 0 \leq x \leq 1
\end{array}
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## Dual Linear Program: Minimum Vertex Cover

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\begin{aligned}
& \sum_{v \in V} x_{v} \leq n-1 \\
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& x_{v}+x_{u} \geq 1 \quad \forall(u, v) \in E_{B} \\
& 0 \leq x \leq 1
\end{aligned}
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■ ( $P$ ) feasible $\Longleftrightarrow$ No perfect matching exists

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\begin{aligned}
& \sum_{v \in V} x_{v} \leq n-\frac{1}{2} \\
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- ( $P$ ) feasible $\Longleftrightarrow$ No perfect matching exists
- $(P)$ feasible $\Longrightarrow \operatorname{Vol}(P) \geq\left(\frac{1}{20 n}\right)^{5 n}$


## Cutting Planes Method

## Separation Oracle:

Given $y \in \mathbb{R}^{n}$, return either:

- " $y$ is in ( $P$ )"
- Violated hyperplane: " $c$ ${ }^{\top} x \leq d$ "
- valid for all $x \in(P)$
- not valid for $y$

Goal: Find point in unknown polytope $(P)$
Given: $(Q)$ containing ( $P$ ) Separation Oracle

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## Center-of-gravity Cutting Planes [Levin'65] [Newman'65]

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Given: $(Q)$ containing $(P)$

1. Pick $y=\frac{\int_{Q} z \mathrm{~d} z}{\int_{Q} \mathrm{~d} z}=$ center-of-gravity of $(Q)$

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## Center-of-gravity Cutting Planes [Levin'65] [Newman'65]

Goal: Find point in unknown polytope $(P)$
Given: $(Q)$ containing ( $P$ ) Separation Oracle
$\# P$-hard to compute
We don't care!
$\longrightarrow 1$. Pick $y=\frac{\int_{Q} z \mathrm{~d} z}{\int_{Q} \mathrm{~d} z}=$ center-of-gravity of $(Q)$
2. Call separation oracle and update $(Q)$

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## Cutting Planes for Biparite Matching

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\begin{array}{ll:l}
\sum_{v \in V} x_{v} \leq n-\frac{1}{2} & (Q) & \sum_{v \in V} x_{v} \leq n-\frac{1}{2} \\
& x_{v}+x_{u} \geq 1 \quad \forall(u, v) \in E_{A} \\
x_{v}+x_{u} \geq 1 \quad \forall(u, v) \in E_{B}  \tag{P}\\
0 \leq x \leq 1 & 0 \leq x \leq 1
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## Algorithm

- $E_{\text {common }}=\varnothing, \quad Q=\left\{x \in[0,1]^{V}: \sum x_{v} \leq n-\frac{1}{2}\right\}$
- While $\operatorname{vol}(Q)>0$ :
- Let $c=$ center-of-gravity $(Q) \quad$ "fractional vertex cover"
- If either Alice or Bob have an edge ( $u, v$ ) violating $c$ : add it to $E_{\text {common }}$ and add " $x_{v}+x_{u} \geq 1$ " to ( $Q$ )
- If not, return $c$ as a fractional vertex cover
- $E_{\text {common }}$ must now contain a perfect matching.


## OR-Query Algorithm

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- While $\operatorname{vol}(Q)>0$ :
- Let $c=$ center-of-gravity $(Q) \quad$ "fractional vertex cover"
- Binary search with OR-queries to find violated edge in $S=\left\{(u, v) \in L \times R: c_{u}+c_{v}<1\right\}$
- If not, return $c$ as a fractional vertex cover
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## Analysis

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- Volume:
- Initially $\leq 1$ (contained in $[0,1]^{2 n}$ ).
$\Longrightarrow O(n \log n)$ iterations
- Always $\geq\left(\frac{1}{20 n}\right)^{5 n}$ whenever $(Q)$ is non-empty.


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- Always $\geq\left(\frac{1}{20 n}\right)^{5 n}$ whenever $(Q)$ is non-empty.
$\Longrightarrow O(n \log n)$ iterations


## Main Result:

One can solve bipartite matching in $O\left(n \log ^{2} n\right)$ bits of communication.

## Extensions

$$
\begin{array}{lll}
\min & \sum_{v \in V} x_{v} & \\
\text { s.t. } & x_{v}+x_{u} \geq 1 & \forall(u, v) \in E_{A} \\
& x_{v}+x_{u} \geq 1 & \forall(u, v) \in E_{B} \\
& 0 \leq x \leq 1 &
\end{array}
$$

## Weights and Demands!

$$
\begin{array}{lll}
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\text { s.t. } & x_{v}+x_{u} \geq c_{u v} & \forall(u, v) \in E_{A} \\
& x_{v}+x_{u} \geq c_{u v} & \forall(u, v) \in E_{B} \\
& 0 \leq x \leq W &
\end{array}
$$

- $W:=\max \left\{\left|c_{u v}\right|,\left|b_{v}\right|, 1\right\}$
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## Other (Equivalent \& Weaker) Problems

## Theorem:

If weights/costs/capacities/demands are poly $(n)$, then we can solve the following using $O\left(n \log ^{2} n\right)$ communication:

- Maximum-cost bipartite perfect $b$-matching
- Maximum-cost bipartite $b$-matching
- Vertex-capacitated minimum-cost ( $s, t$ )-flow
- Transshipment
- Negative-weight single source shortest path
- Minimum mean cycle


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Note: All these have $O(n)$ edges in their answer!

## Query Lower-Bounds

- AND-query $S=\{(u, v) \in L \times R\}$ :
"Is $|S \cap E|=|S|$ ?"


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$E_{A}$

$E=E_{A} \cup E_{B}$


## Bob


$E_{B}$

## Query Lower-Bounds

- AND-query $S=\{(u, v) \in L \times R\}$ : "Is $|S \cap E|=|S|$ ?"
- AND-query algorithm $\Longrightarrow$ communication protocol on intersection graph

$E_{A}$

$E=E_{A} \cap E_{B}$

$E_{B}$


## Query Lower-Bounds

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## Query Lower-Bounds

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- Perfect matching $\Longleftrightarrow$ edges intersect
- Set-Intersection on $\approx n^{2}$ bits. Needs $\Omega\left(n^{2}\right)$ communication!


## Summary - Results

| Models | Previous papers |  | This paper |
| :---: | :---: | :---: | :---: |
|  | Lower bounds | Upper bounds |  |
| Two-party communication | $\Omega(n)$ Rand, $\Omega(n \log n)$ Det, Footnote 1 and 2 | $\begin{gathered} \tilde{O}\left(n^{1.5}\right) \\ {\left[\text { DNO19, IKL }{ }^{+} 12\right]} \end{gathered}$ | $\begin{gathered} O\left(n \log ^{2} n\right), \text { Det } \\ \text { Theorem 1.1 } \end{gathered}$ |
| Quantum edge query | $\begin{gathered} \Omega\left(n^{1.5}\right) \\ {[\text { Zha04, Ben22b] }} \end{gathered}$ | $\begin{gathered} O\left(n^{1.75}\right) \\ {[\text { LL15] }} \end{gathered}$ | $\tilde{O}\left(n^{1.5}\right)$ <br> Theorem 1.3 |
| OR-query | $\Omega(n)$ Rand, $\Omega(n \log n)$ Det, [BN21] | $\begin{gathered} \tilde{O}\left(n^{1.5}\right) \text { Det, } \\ {[\text { Nis21] }} \end{gathered}$ | $\begin{gathered} O\left(n \log ^{2} n\right), \text { Det } \\ \text { Theorem } 1.3 \end{gathered}$ |
| XOR-query | $\Omega(n)$ Rand $\Omega\left(n^{2}\right)$ Det [BN21] | $\begin{gathered} \tilde{O}\left(n^{1.5}\right) \text { Rand } \\ \text { Lemma } 2.14 \text { and [Nis21] } \end{gathered}$ | $\begin{gathered} O\left(n \log ^{2} n\right), \text { Rand } \\ \text { Theorem } 1.3 \end{gathered}$ |
| AND-query | $\Omega(n)$ Rand, $\Omega\left(n^{2}\right)$ Det [BN21] | $\begin{aligned} & O\left(n^{2}\right) \\ & \text { Trivial } \end{aligned}$ | $\Omega\left(n^{2}\right)$, Rand <br> Theorem 1.3 |

Open Problems :)

## Open Problem - Round vs Communication Tradeoff

- Restricting the \#rounds:
- Streaming
- Distributed
- MPC - ...


## Rounds

trivial: $\quad 1$
?
cutting-planes: $\quad O(n \log n)$

Communication
$\Theta\left(n^{2}\right)$
?
$O\left(n \log ^{2} n\right)$

## Open Problem - Approximation

- Finding an $\alpha$-approximation instead? (size version)

Approximation
1
?
2

Communication
$O\left(n \log ^{2} n\right)$ ?
$O(\log n)$

## Open Problems - General Matching

- Communication and Query complexity of General Matching?
- Interplay between general and bipartite matching unclear...
- Optimal fractional matching by same approach.
- Answer also has only $O(n)$ edges.
- Unwieldy Linear Program...



## Open Problems - Max Flow

- Communication and Query complexity of s,t-(min-cost)-max-flow?
- Both the dual \& primal have $\approx n^{2}$ variables
- Answer may include all $\approx n^{2}$ edges
- Nondeterministic (certificate) complexity are still low: $\tilde{O}(n)$



## Open Problems

- Rounds vs Communication tradeoff
- Approximate bipartite matching
- Communication complexity of other problems?
- General Matching
- Max flow
- Matroid intersection
- Other query models, e.g. demand queries (one-sided OR)
- Multiparty communication

