An Improved Combinatorial Algorithm for Boolean Matrix Multiplication

Huacheng Yu

Stanford University

June 8, 2016



Boolean Matrix Multiplication (Boolean MM or BMM):

$$egin{pmatrix} 1 & 0 & \cdots & 1 \ 0 & 1 & \cdots & 0 \ 1 & 1 & \cdots & 1 \ dots & dots & \ddots & dots \ 1 & 0 & \cdots & 0 \end{pmatrix} \cdot egin{pmatrix} 0 & 0 & \cdots & 1 \ 1 & 1 & \cdots & 0 \ 1 & 0 & \cdots & 0 \ dots & dots & \ddots & dots \ 1 & 1 & \cdots & 1 \end{pmatrix} =$$

Boolean Matrix Multiplication (Boolean MM or BMM):

$$\begin{pmatrix} 1 & 0 & \cdots & 1 \\ 0 & 1 & \cdots & 0 \\ a_{i,1} & a_{i,2} & \cdots & a_{i,n} \\ \vdots & \vdots & \ddots & \vdots \\ 1 & 0 & \cdots & 0 \end{pmatrix} \cdot \begin{pmatrix} 0 & b_{1,j} & \cdots & 1 \\ 1 & b_{2,j} & \cdots & 0 \\ 1 & b_{3,j} & \cdots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ 1 & b_{n,j} & \cdots & 1 \end{pmatrix} = \begin{pmatrix} 1 & 1 & \cdots & 1 \\ 1 & 1 & \cdots & 0 \\ 1 & c_{i,j} & \cdots & 1 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & 1 \end{pmatrix}$$

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Algebraic algorithms!



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- This paper [2015]: $\hat{O}(n^3/\log^4 n)$

Algebraic vs Combinatorial

On Boolean MM:

Algebraic Algorithms Combinatorial Algorithms

Asymptotically faster Asymptotically slower

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Difficult to implement Very simple slow in practice fast in practice

Algebraic vs Combinatorial

On Boolean MM:

Algebraic Algorithms

Asymptotically faster

Difficult to implement slow in practice

Require similar algebraic structure to generalize

Combinatorial Algorithms

Asymptotically slower

Very simple fast in practice

Generalizable in a different way

Combinatorial algorithms can:

• solve edit distance in $o(n^2)$

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Vassilevska Williams and Williams [2010] proved:

Triangle detection $\stackrel{\text{"sub-cubic"}}{\longleftrightarrow}$ Boolean MM

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Vassilevska Williams and Williams [2010] proved:

Triangle detection
$$\stackrel{\text{"sub-cubic"}}{\longleftarrow}$$
 Boolean MM
$$O(\mathfrak{n}^3/g(\mathfrak{n})) \xrightarrow{\text{combinatorial}} O(\mathfrak{n}^3/g(\mathfrak{n}^{1/3}))$$

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A general framework for triangle detection:

"Theorem"

If there is an algorithm that takes a graph and can "efficiently" find and solve triangle detection on a "large" subgraph, then triangle detection is "easy" in general.

Triangle Detection Algorithm

Preliminaries

Wish to detect if a graph G contains a triangle.

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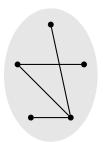
Wish to detect if a graph G contains a triangle.

Observation: can assume G is tripartite.

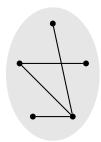
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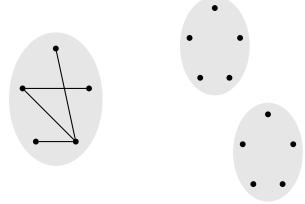


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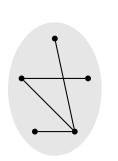


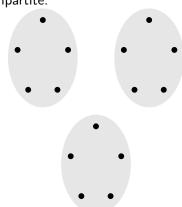


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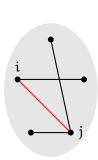


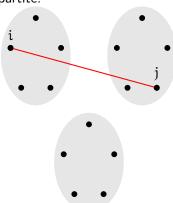
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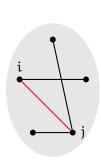


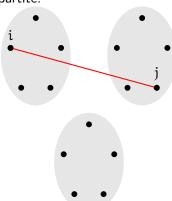
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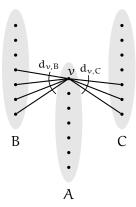
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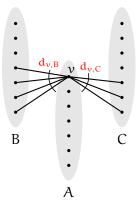


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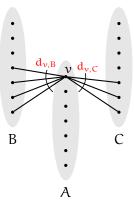
 One naïve approach: for v ∈ A, check edge between its neighbours



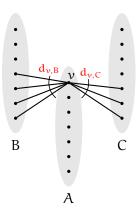
- One naïve approach: for $v \in A$, check edge between its neighbours
- spend $d_{v,B}d_{v,C}$ time



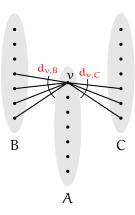
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- fast if $d_{v,B}d_{v,C}$ small on average



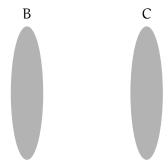
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- spend $d_{v,B}d_{v,C}$ time
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- otherwise can find large "non-edge area" between B and C

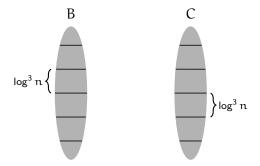


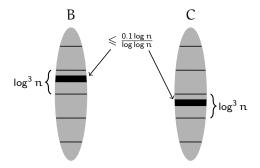
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- recursion! (also used in Chan's algorithm)

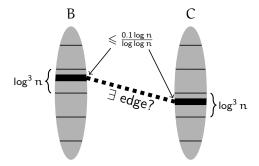


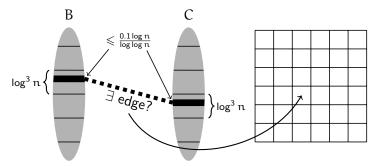
The sparse case: $d_{\nu,B} \, d_{\nu,C} \leqslant \hat{O}(n^2/\log^2 n)$ for every $\nu \in A.$



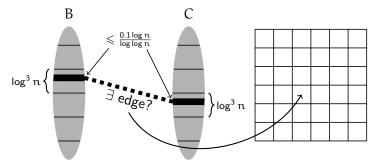








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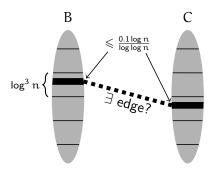
Preprocessing: $n^2(\log^3 n)^{0.2\log n/\log\log n} = O(n^{2.6})$.



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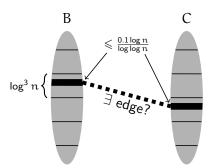


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 for v ∈ A, partition its neighbourhood into small subsets within each block

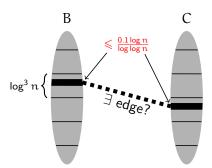


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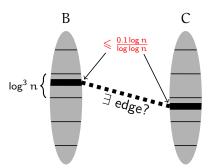


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- for v ∈ A, partition its neighbourhood into small subsets within each block
- check each pair of small subsets by lookup table

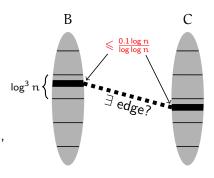


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- for v ∈ A, partition its neighbourhood into small subsets within each block
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- $\hat{O}(d_{\nu,B}/\log n + n/\log^3 n)$, $\hat{O}(d_{\nu,C}/\log n + n/\log^3 n)$ small subsets respectively



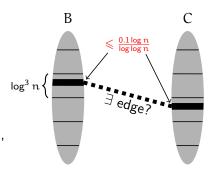
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- $\hat{O}(d_{\nu,B}/\!\log n + n/\log^3 n), \\ \hat{O}(d_{\nu,C}/\!\log n + n/\log^3 n) \\ \text{small subsets respectively}$

Spend $\hat{O}(n^3/\log^4 n)$ in total.



Given an n-node tripartite graph, fix $\Delta = \frac{\log n}{100(\log \log n)^2}$.

Step 0:

Step 1:

Step 2:

Step 3:

Step 4:

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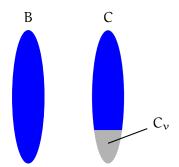
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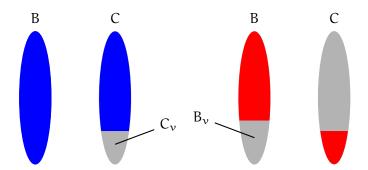
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Correctness: straightforward.



- Step 0: If $|B| < \sqrt{n}$ or $|C| < \sqrt{n}$, use exhaustive search;
- Step 1: If for every $v \in A$, $d_{v,B} d_{v,C} \leq |B||C|/\Delta^2$, use the sparse case algorithm;
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                                                              \hat{O}(n|B||C|/\log^4 n)
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                                                                  O(n(|B| + |C|))
Step 3: Check all pairs in B_v \times C_v for an edge;
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Step 4: If |B_y|/|B| > |C_y|/|C|.
           then recurse on (A, B, C \setminus C_{\nu}) and (A, B \setminus B_{\nu}, C_{\nu}),
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                                                                  O(n(|B| + |C|))
```

- Small graph case:
- Step 0: If $|B| < \sqrt{n}$ or $|C| < \sqrt{n}$, use exhaustive search; O(n|B||C|)
- Step 1: If for every $v \in A$, $d_{v,B}d_{v,C} \le |B||C|/\Delta^2$, use the sparse case algorithm; $\hat{O}(n|B||C|/\log^4 n)$
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- Step 3: Check all pairs in $B_{\nu} \times C_{\nu}$ for an edge; $O(|B_{\nu}||C_{\nu}|)$
- Step 4: If $|B_{\nu}|/|B| > |C_{\nu}|/|C|$, then recurse on $(A, B, C \setminus C_{\nu})$ and $(A, B \setminus B_{\nu}, C_{\nu})$, else recurse on $(A, B \setminus B_{\nu}, C)$ and $(A, B_{\nu}, C \setminus C_{\nu})$.

$$O(\mathfrak{n}(|B|+|C|))$$

- Small graph case:
- Step 0: If $|B| < \sqrt{n}$ or $|C| < \sqrt{n}$, use exhaustive search; O(n|B||C|)
- Large graph case:
- Step 1: If for every $v \in A$, $d_{v,B}d_{v,C} \le |B||C|/\Delta^2$, use the sparse case algorithm; $\hat{O}(n|B||C|/\log^4 n)$
- Step 2: Otherwise, find a $v \in A$ such that $d_{v,B}d_{v,C} \ge |B||C|/\Delta^2$; let B_v [resp. C_v] be v's neighbourhood in B [resp. C]; O(n(|B| + |C|))
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- Small graph case

```
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- Large graph case:

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Step 2: Otherwise, find a $v \in A$ such that $d_{v,B} d_{v,C} \ge |B||C|/\Delta^2$; let B_v [resp. C_v] be v's neighbourhood in B [resp. C]; O(n(|B| + |C|))

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Step 3: Check all pairs in B_{\nu} \times C_{\nu} for an edge; O(|B_{\nu}||C_{\nu}|)
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, then recurse on $(A,B,C\setminus C_{\nu})$ and $(A,B\setminus B_{\nu},C_{\nu})$, else recurse on $(A,B\setminus B_{\nu},C)$ and $(A,B_{\nu},C\setminus C_{\nu})$.
$$O(n(|B|+|C|))$$

```
Large graph case (|B|, |C| \geqslant \sqrt{n}):
Step 1: If for every v \in A, d_{v.B}d_{v.C} \leq |B||C|/\Delta^2, use the sparse
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Step 4: If |B_y|/|B| > |C_y|/|C|.
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           else recurse on (A, B \setminus B_{\nu}, C) and (A, B_{\nu}, C \setminus C_{\nu}).
                                                                   O(n(|B| + |C|))
```

```
Large graph case (|B|, |C| \geqslant \sqrt{n}):

• sparse case algorithm.

$\hat{O}(n|B||C|/\log^4 n)$
$$ Step 2: Otherwise, find a $\nu \in A$ such that $d_{\nu,B}d_{\nu,C} \ge |B||C|/\Delta^2$; let $B_{\nu}$ [resp. $C_{\nu}$] be $\nu'$'s neighbourhood in $B$ [resp. $C$]$; $O(n(|B|+|C|))$
$$ Step 3: Check all pairs in $B_{\nu} \times C_{\nu}$ for an edge; $O(|B_{\nu}||C_{\nu}|)$
$$ Step 4: If $|B_{\nu}|/|B| > |C_{\nu}|/|C|$, then recurse on $(A,B,C \ C_{\nu})$ and $(A,B \ B_{\nu},C_{\nu})$, else recurse on $(A,B \ B_{\nu},C)$ and $(A,B_{\nu},C \ C_{\nu})$.
```

Large graph case (|B|, $|C| \geqslant \sqrt{n}$):

- sparse case algorithm. $\hat{O}(n|B||C|/\log^4 n)$
- check degrees, generate inputs for recursion. O(n(|B| + |C|))

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Charge the running time to pairs in $B \times C$:

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- check $B_{\nu} \times C_{\nu}$. $O(|B_{\nu}||C_{\nu}|)$

Charge the running time to pairs in $B \times C$:

• sparse case: charge to $B \times C$ evenly. $\hat{O}(n/\log^4 n)$ per pair

Large graph case ($|B|, |C| \ge \sqrt{n}$):

sparse case algorithm.

- $\hat{O}(n|B||C|/\log^4 n)$
- check degrees, generate inputs for recursion. O(n(|B| + |C|))
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Every pair is charged at most once!

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- check $B_v \times C_v$. $O(|B_v||C_v|)$

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Time spent on large graph case: $\hat{O}(n^3/\log^4 n)$.



- Small graph case:

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Step 0: If |B| < \sqrt{n} or |C| < \sqrt{n}, use exhaustive search; O(n|B||C|)
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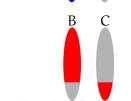
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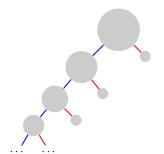
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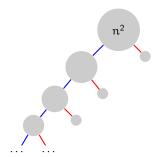
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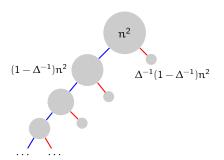
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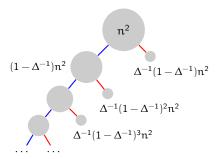
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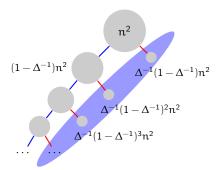
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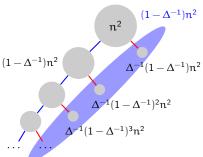
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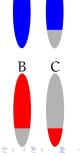
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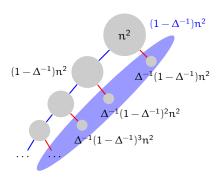
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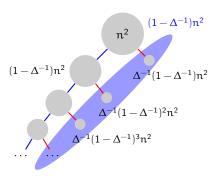
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 $\Omega(\Delta \log \log n)$ right steps: $O(n^3/\log^{10} n)$

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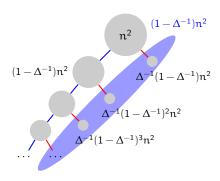


$$\Omega(\Delta \log \log n)$$
 right steps: $O(n^3/\log^{10} n)$

nodes with $O(\Delta \log \log n)$ right steps: $n^{0.4}$

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$$|B| < \sqrt{n}$$
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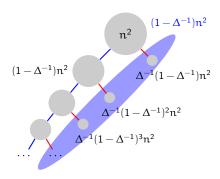


$$\frac{\Omega(\Delta \log \log n)}{O(n^3/\log^{10} n)} \text{ right steps:}$$

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nodes with $O(\Delta \log \log n)$ right steps: $n^{0.4}$

 $O(n^3/\log^{10} n)$ time.

The Algorithm

- Given an n-node tripartite graph, fix $\Delta = \frac{\log n}{100(\log \log n)^2}$.
- Step 0: If $|B| < \sqrt{n}$ or $|C| < \sqrt{n}$, use exhaustive search;
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Correctness: straightforward.



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- Correctness: straightforward. Running time: $\hat{O}(n^3/\log^4 n)$.

• $\hat{O}(n^3/\log^4 n)$ time algorithm for triangle detection and Boolean MM

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 - Multiplying $n \times n$ and $n \times \hat{O}(\log^4 n)$ Boolean matrices in $O(n^2)$

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- A general framework for triangle detection
- Open problem:
 - Triangle detection on tripartite graphs with vertex set sizes $n, n, \hat{O}(\log^4 n)$ in $O(n^2)$ time?
 - Multiplying $n \times n$ and $n \times \hat{O}(\log^4 n)$ Boolean matrices in $O(n^2)$
 - Current record: $\hat{O}(\log^3 n)$ by Chan.

- $\hat{O}(n^3/\log^4 n)$ time algorithm for triangle detection and Boolean MM
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Thanks!

