

Deterministic  $(\frac{2}{3} - \varepsilon)$ -approximation of  
Matroid Intersection  
Using Nearly-Linear Independence-Oracle Queries

Tatsuya Terao (Kyoto University)

WADS 2025 @ Toronto

# What is Matroid?

Def.

A finite set  $V$  and non-empty collection  $I$  of subset of  $V$

s.t. ①  $S' \subseteq S \in I \Rightarrow S' \in I$

②  $S, T \in I, |S| > |T| \Rightarrow \exists e \in S \setminus T \text{ s.t. } T \cup \{e\} \in I$

# What is Matroid? - Generalization of Linear Independence

Def.

A finite set  $V$  and non-empty collection  $I$  of subset of  $V$

s.t. ①  $S' \subseteq S \in I \Rightarrow S' \in I$

②  $S, T \in I, |S| > |T| \Rightarrow \exists e \in S \setminus T \text{ s.t. } T \cup \{e\} \in I$

e.g. • Linear matroid

$$\left( \begin{array}{c|c|c} 1 & 1 & 2 \\ \hline 2 & 1 & 2 \end{array} \right)$$

$$V = \{ \textcircled{1}, \textcircled{2}, \textcircled{3} \}$$

$$I = \{ \emptyset, \{ \textcircled{1} \}, \{ \textcircled{2} \}, \{ \textcircled{3} \}, \{ \textcircled{1}, \textcircled{2} \}, \{ \textcircled{1}, \textcircled{3} \} \}$$

# What is Matroid? - Generalization of Linear Independence

Def.

A finite set  $V$  and non-empty collection  $I$  of subset of  $V$

s.t. ①  $S' \subseteq S \in I \Rightarrow S \in I$

②  $S, T \in I, |S| > |T| \Rightarrow \exists e \in S \setminus T \text{ s.t. } T \cup \{e\} \in I$

e.g. • Linear matroid

$$\left( \begin{array}{c|c|c} 1 & 1 & 2 \\ 2 & 1 & 2 \end{array} \right)$$

$$V = \{ \textcircled{1}, \textcircled{2}, \textcircled{3} \}$$

$$I = \{ \emptyset, \{ \textcircled{1} \}, \{ \textcircled{2} \}, \{ \textcircled{3} \}, \{ \textcircled{1}, \textcircled{2} \}, \{ \textcircled{1}, \textcircled{3} \} \}$$

$\boxed{S \in I : S \text{ is independent}}$

# What is Matroid? - Generalization of Linear Independence

Def.

A finite set  $V$  and non-empty collection  $I$  of subsets of  $V$

s.t. ①  $S' \subseteq S \in I \Rightarrow S' \in I$

②  $S, T \in I, |S| > |T| \Rightarrow \exists e \in S \setminus T \text{ s.t. } T \cup \{e\} \in I$

e.g. • Linear matroid

1	1	2
2	1	2

$$V = \{ \textcircled{1}, \textcircled{2}, \textcircled{3} \}$$

$$I = \{ \emptyset, \{\textcircled{1}\}, \{\textcircled{2}\}, \{\textcircled{3}\}, \{\textcircled{1}, \textcircled{2}\}, \{\textcircled{1}, \textcircled{3}\} \}$$

- partition matroid
- laminar matroid
- graphic matroid

etc...

# What is Matroid Intersection?

input: two matroids  $M_1 = (V, I_1)$ ,  $M_2 = (V, I_2)$

output: maximum common independent set  $S \in I_1 \cap I_2$

# What is Matroid Intersection?

— Generalization of Bipartite Matching

input: two matroids  $M_1 = (V, I_1)$ ,  $M_2 = (V, I_2)$

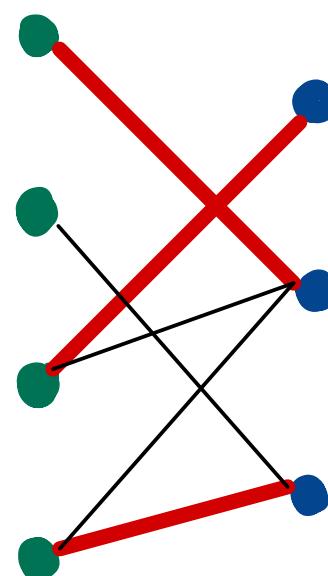
output: maximum common independent set  $S \in I_1 \cap I_2$

e.g. Maximum Bipartite Matching

$V =$  edges

$I_1 =$  each left vertex has at most 1 edge

$I_2 =$  each right vertex has at most 1 edge



# What is Matroid Intersection?

— Generalization of Bipartite Matching

input: two matroids  $M_1 = (V, I_1)$ ,  $M_2 = (V, I_2)$

output: maximum common independent set  $S \in I_1 \cap I_2$

## Why this problem matters?

# What is Matroid Intersection?

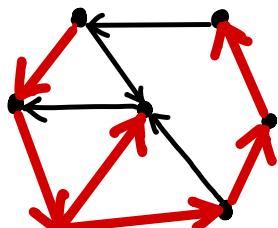
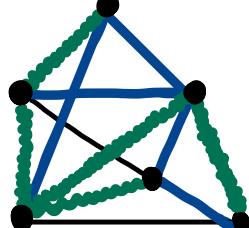
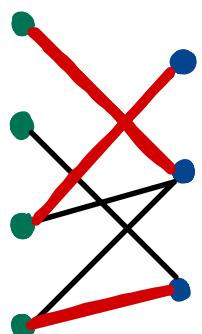
— Generalization of Bipartite Matching

input: two matroids  $M_1 = (V, I_1)$ ,  $M_2 = (V, I_2)$

output: maximum common independent set  $S \in I_1 \cap I_2$

Why this problem matters?

- ① Generalize many problems
- Bipartite Matching
  - Packing Spanning Tree
  - Arborescences



# What is Matroid Intersection?

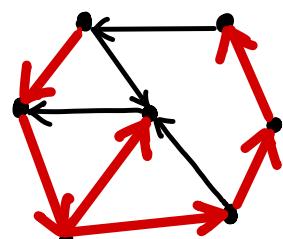
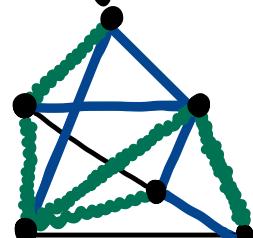
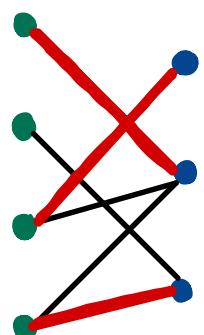
— Generalization of Bipartite Matching

input: two matroids  $M_1 = (V, I_1)$ ,  $M_2 = (V, I_2)$

output: maximum common independent set  $S \in I_1 \cap I_2$

## Why this problem matters?

- ① Generalize many problems
- Bipartite Matching
  - Packing Spanning Tree
  - Arborescences



- ② Applications extend beyond Combinatorial Optimization
- electrical engineering
  - network coding

input:  $(U, I_1), (V, I_2)$   
max  $|S|$  s.t.  $S \in I_1 \cap I_2$

Matroid Intersection can be solved

in Polynomal time

[Edmonds'70, Aigner-Douling'71, Lawler'75]

input:  $(U, I_1), (V, I_2)$   
max  $|S|$  s.t.  $S \in I_1 \cap I_2$

Matroid Intersection can be solved

in Polynomial time

[Edmonds'70, Aigner-Douling'71, Lawler'75]

Matroid is given via an independence oracle

Query

Is  $S \in I$ ?

Independence Oracle

Answer

Yes or No

Time Complexity = # of Queries

# Time Complexity of Matroid Intersection

# of queries

to independence oracle

input :  $(V, I_1), (V, I_2)$   
 $\max |S| \text{ s.t. } S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$

# Time Complexity of Matroid Intersection

input :  $(V, I_1), (V, I_2)$   
 $\max |S| \text{ s.t. } S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$

1970s

Edmonds, Lawler, Aigner-Dorling

# of queries

1986

Cunningham

to independence oracle

$O(nr^2)$

$O(nr^{3/2})$

# Time Complexity of Matroid Intersection

input :  $(U, I_1), (V, I_2)$   
 $\max |S| \leq r$  s.t.  $S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$

1970s

Edmonds, Lawler, Aigner-Dorling

# of queries

to independence oracle

$O(nr^2)$

1986

Cunningham

$O(nr^{3/2})$

2015

Lee - Sidford - Wong

$\tilde{O}(n^2)$

2019

Nguyen, Chakrabarty - Lee - Sidford - Singla - Wong

$\tilde{O}(nr)$

2021

Blikstad - v.d. Brand - Mukhopadhyay - Namngkai

$\tilde{O}(n^{9/5})$

2021

Blikstad  $\ddagger$

$\tilde{O}(nr^{3/4})$

$\ddagger$ : [Blikstad21] :  $\tilde{O}(nr^{3/4})$  if randomized,  $\tilde{O}(nr^{5/6})$  if deterministic

Today's Focus: *Nearly Linear-Time Algo.*

$O(n \cdot \text{polylog}(n))$ -time

Today's Focus: *Nearly Linear-Time* Algo.

$$O(n \cdot \text{polylog}(n))\text{-time}$$

\* Targeting Approximation Rather than Exact Solution

$$\begin{aligned} \alpha\text{-approx. : } & S \in I_1 \wedge I_2 \\ \text{s.t. } & |S| \geq \alpha \cdot \text{OPT} \end{aligned}$$

# Today's Focus: *Nearly Linear-Time* Algo.

$O(n \cdot \text{polylog}(n))$ -time

## \* Targeting Approximation Rather than Exact Solution

$\alpha$ -approx.:  $SEI_1 \cap I_2$   
s.t.  $|S| \geq \alpha \cdot OPT$

e.g.

sparse cut : Khandekar-Rao-Vazirani'09, Madry'10

$k$ -cut : Quanrud'19

$k$ -ECSS : Chalermsook-Huang-Nansgkai-Saranak-Sukprasert-Yingcharoenwanichai'22

Weighted matching : Preis'99, Vinkemeier-Haugard'03, Duan-Pettie'14, Zhang-Henzinger'23

# Nearly-Linear Time Algo.

for Matroid Intersection

Folklore

$\frac{1}{2}$ -approx.

$O(n)$  queries

input:  $(V, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $\alpha\text{-approx.}: \text{find } S \in I_1 \cap I_2 \text{ s.t. } |S| \geq \alpha \cdot r$

# Nearly-Linear Time Algo.

input:  $(V, I_1), (V, I_2)$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cap I_2} |S|$   
 $\alpha\text{-approx.} : \text{find } S \in I_1 \cap I_2$   
s.t.  $|S| \geq \alpha \cdot r$

for Matroid Intersection

Folklore	$\frac{1}{2}$ -approx.	$O(n)$ queries
Guruganesh-Singla '17	$(\frac{1}{2} + \bar{o}^4)$ -approx.	$O(n)$ queries

# Nearly-Linear Time Algo.

for Matroid Intersection

input:  $(V, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $\alpha\text{-approx.}: \text{find } S \in I_1 \cap I_2 \text{ s.t. } |S| \geq \alpha \cdot r$

Folklore

Guruganesh-Singla '17

Quanrud '24

Blikstad-Tu '25

$\frac{1}{2}$ -approx.

$(\frac{1}{2} + \bar{o}^4)$ -approx.

$(1 - \varepsilon)$ -approx.

$(1 - \varepsilon)$ -approx.

$O(n)$  queries

$O(n)$  queries

$\tilde{O}_\varepsilon(n + r^{3/2})$  queries

$\tilde{O}_\varepsilon(n)$  queries

# Nearly-Linear Time Algo.

input:  $(V, I_1), (V, I_2)$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cup I_2} |S|$   
 $\alpha\text{-approx.} : \text{find } S \in I_1 \cup I_2 \text{ s.t. } |S| \geq \alpha \cdot r$

## for Matroid Intersection

Folklore

Guruganesh-Singla '17

All recent algo. are randomized!

Blikstad-Tu '25

$\frac{1}{2}$ -approx.

$(\frac{1}{2} + 10^{-4})$ -approx.

$(1 - \varepsilon)$ -approx.

$O(n)$  queries

$O(n)$  queries

$\tilde{O}_\varepsilon(n)$  queries

Q. What about deterministic algo.?

Q. What about deterministic algo.?

input:  $(U, I_1), (V, I_2)$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cup I_2} |S|$   
 $\alpha$ -approx.: find  $S \in I_1 \cup I_2$   
s.t.  $|S| \geq \alpha \cdot r$

Only a trivial  $O(n)$ -query  $\frac{1}{2}$ -approx. algo. is known.

Q. What about deterministic algo.?

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $\alpha\text{-approx.}: \text{find } S \in I_1 \cap I_2 \text{ s.t. } |S| \geq \alpha \cdot r$

Only a trivial  $O(n)$ -query  $\frac{1}{2}$ -approx. algo. is known.

### Greedy algo.

```
S ← φ
for v ∈ V do
    if  $S \cup \{v\} \in I_1 \cap I_2$  then
        S ←  $S \cup \{v\}$ 
return S
```

Q. What about deterministic algo.?

input:  $(U, I_1), (V, I_2)$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cup I_2} |S|$   
 $\alpha$ -approx.: find  $S \in I_1 \cup I_2$   
s.t.  $|S| \geq \alpha \cdot r$

Only a trivial  $O(n)$ -query  $\frac{1}{2}$ -approx. algo. is known.

Main Thm.

$O\left(\frac{n}{\epsilon} + r \log r\right)$ -query  $\left(\frac{2}{3} - \epsilon\right)$ -approx. algo.

# Idea : Analogy from (Bipartite) Matching

## (Bipartite) Matching

Algo.



Finding an augmenting path  $P$

No Path

Output  $M$

$M \leftarrow M \oplus P$

[Kahn '55]  
[Edmonds '65]

## Matroid Intersection

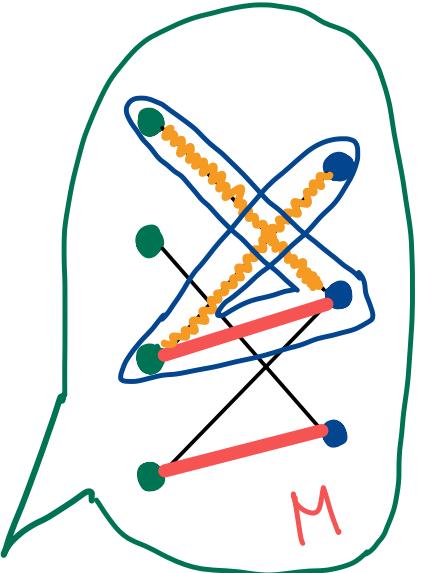
input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea : Analogy from (Bipartite) Matching

## (Bipartite) Matching

Algo.

$M \leftarrow \emptyset$



Finding an  
augmenting path  $P$

No Path

Output  $M$

$M \leftarrow M \oplus P$

[Kahn '55]  
[Edmonds '65]

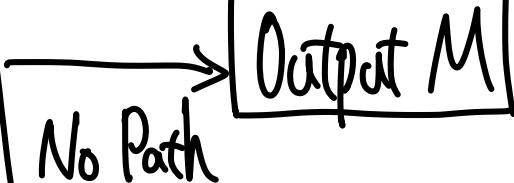
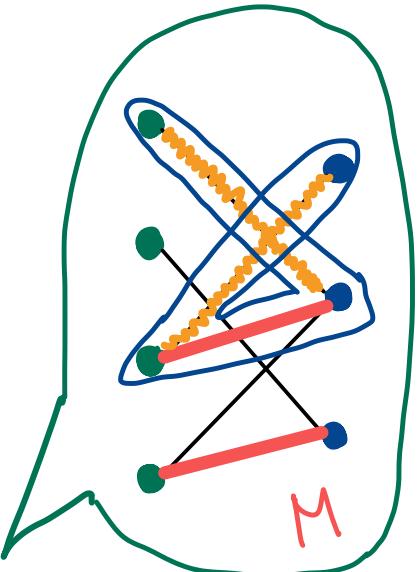
## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 find  $S \in I_1 \cap I_2$   
 s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
 using  $O(n/\epsilon + r \log r)$  queries

# Idea : Analogy from (Bipartite) Matching

## (Bipartite) Matching

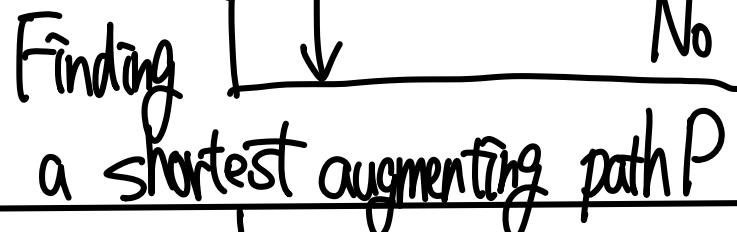
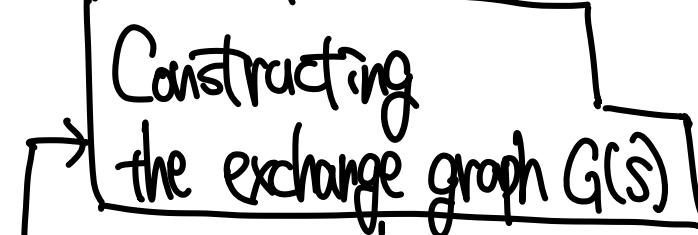
Algo.



[Kahn '55]  
[Edmonds '65]

## Matroid Intersection

Algo.



[Edmonds '70]

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 find  $S \in I_1 \cap I_2$   
 s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
 using  $O(n/\epsilon + r \log r)$  queries

# Idea : Analogy from (Bipartite) Matching

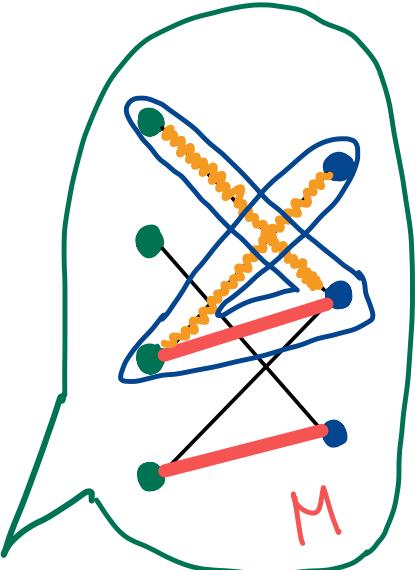
## (Bipartite) Matching

Algo.

$M \leftarrow \emptyset$

Finding an augmenting path  $P$

$M \leftarrow M \oplus P$



No Path

Output  $M$

[Kahn '55]  
[Edmonds '65]

## Matroid Intersection

Algo.

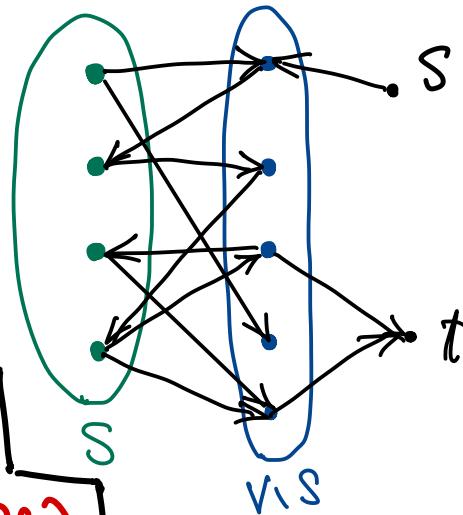
$S \leftarrow \emptyset$

Constructing the exchange graph  $G(S)$

Finding a shortest augmenting path  $P$

$S \leftarrow S \oplus P$

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 find  $S \in I_1 \cap I_2$   
 $\text{s.t. } |S| \geq (\frac{2}{3} - \varepsilon) \cdot r$   
 using  $O(n/\varepsilon + r \log r)$  queries



No Path  
Output  $S$

[Edmonds '70]

# Idea : Analogy from (Bipartite) Matching

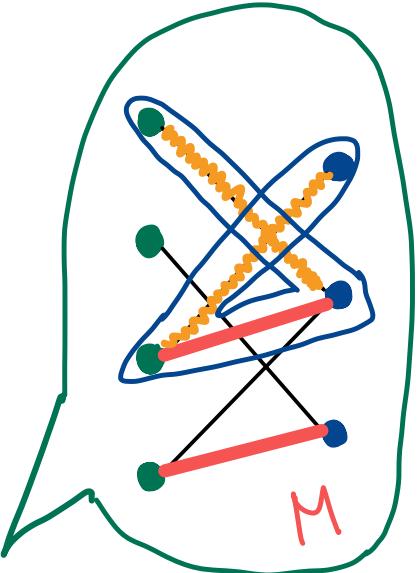
## (Bipartite) Matching

Algo.

$M \leftarrow \emptyset$

Finding an augmenting path  $P$

$M \leftarrow M \oplus P$



No Path

Output  $M$

[Kahn '55]  
[Edmonds '65]

## Matroid Intersection

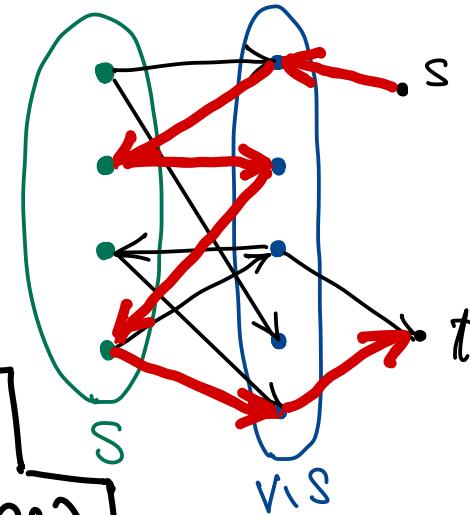
Algo.

$S \leftarrow \emptyset$

Constructing the exchange graph  $G(S)$

Finding a shortest augmenting path  $P$

$S \leftarrow S \oplus P$



No Path

Output  $S$

[Edmonds '70]

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 find  $S \in I_1 \cap I_2$   
 s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
 using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

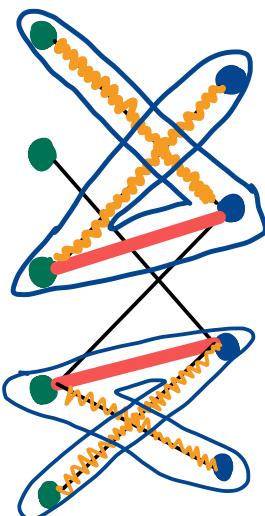
## (Bipartite) Matching

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase  
[Hopcroft - Karp '73]



## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

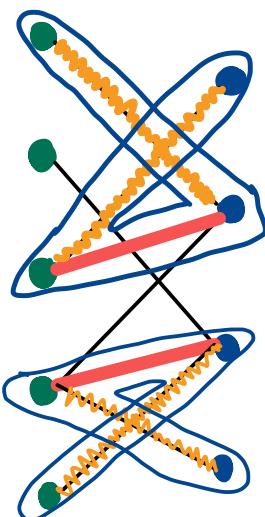
## (Bipartite) Matching

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase  
[Hopcroft - Karp '73]



- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

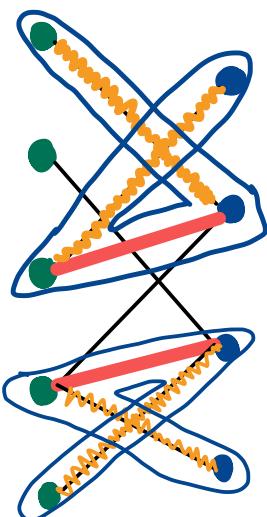
## (Bipartite) Matching

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase  
[Hopcroft - Karp '73]



- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS

## Matroid Intersection

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase

[Cunningham '86]

- Suffices to find a set of vertex-disjoint maximal augmenting paths ?

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

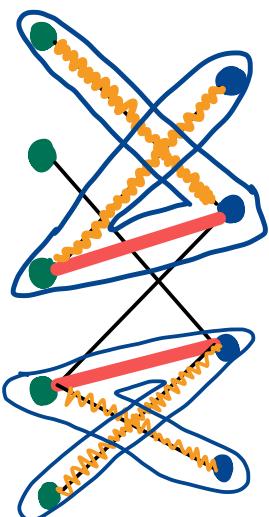
## (Bipartite) Matching

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase  
[Hopcroft - Karp '73]



- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS

## Matroid Intersection

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase

[Cunningham '86]

- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

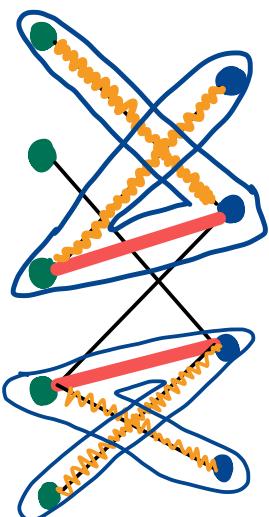
## (Bipartite) Matching

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase  
[Hopcroft - Karp '73]



- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS

## Matroid Intersection

### Fast Algo.

#### \* Blocking Flow

- Find multiple shortest augmenting paths

in one phase

[Cunningham '86]

- Suffices to find a set of vertex-disjoint maximal augmenting paths
- BFS + DFS



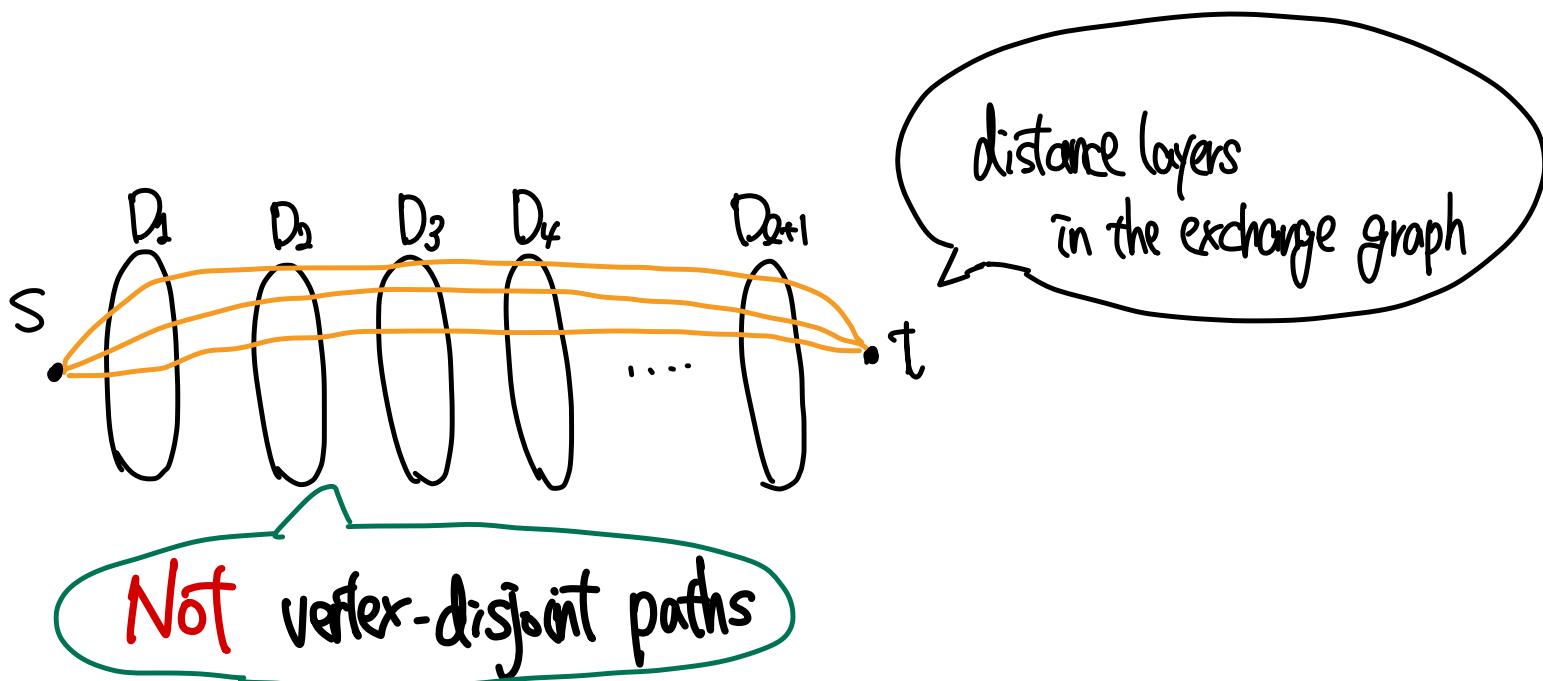
**augmenting sets**  
[CLSSW19]

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# What is "Augmenting Sets"?

## Matroid Intersection

- \* Blocking Flow [Cunningham'86]
  - Find multiple shortest augmenting paths in one phase

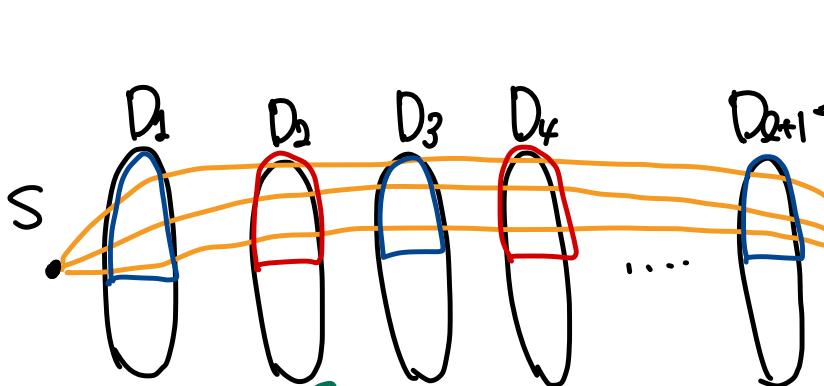


input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# What is "Augmenting Sets"?

## Matroid Intersection

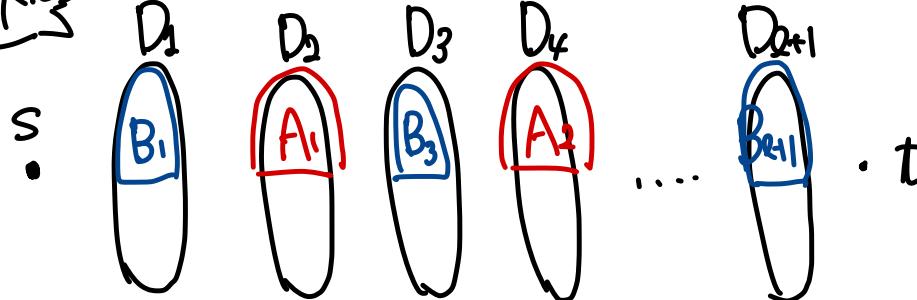
- \* Blocking Flow [Cunningham'86]
  - Find multiple shortest augmenting paths in one phase



## \* Augmenting Sets [CCSW'19]

$$\Pi_Q := (B_1, A_1, B_2, \dots, B_{k+1})$$

- |   |                               |
|---|-------------------------------|
| ① $A_R \subseteq D_{2R}$ , $B_R \subseteq D_{2R+1}$ | ④ $S + B_{k+1} \in I_2$       |
| ② $ B_1  =  A_1  = \dots =  B_{k+1} $               | ⑤ $S - A_R + B_{k+1} \in I_1$ |
| ③ $S + B_1 \in I_1$                                 | ⑥ $S - A_R + B_R \in I_2$     |



input:  $(U, I_1), (V, I_2)$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cap I_2} |S|$   
 find  $S \in I_1 \cap I_2$   
 s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
 using  $O(n/\epsilon + r \log r)$  queries

# What is "Augmenting Sets"?

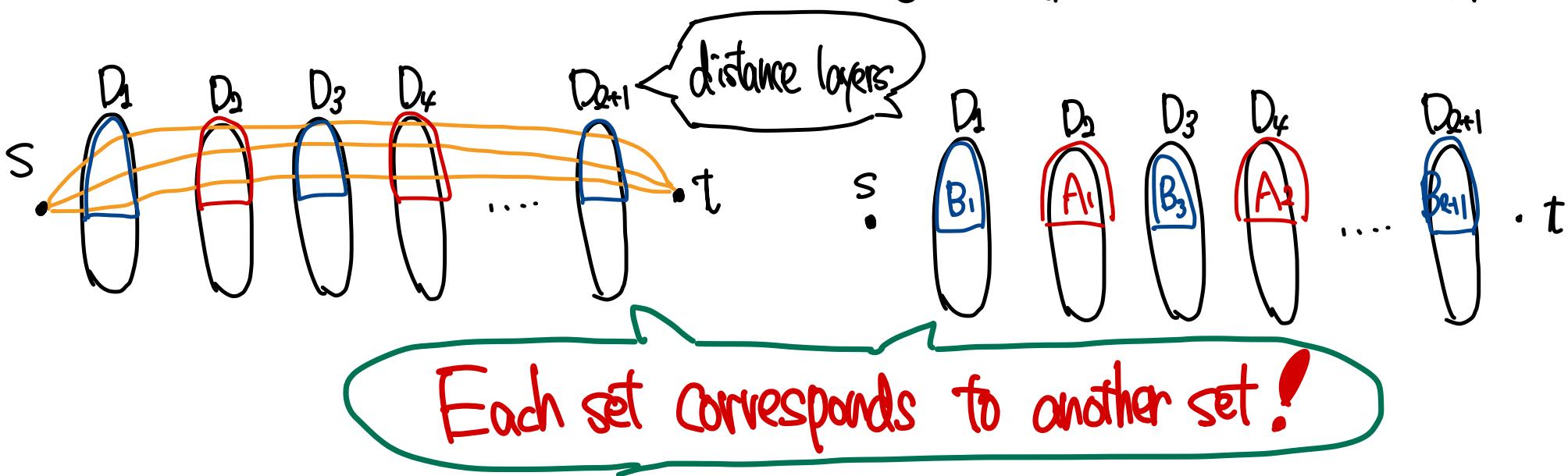
## Matroid Intersection

- \* Blocking Flow [Cunningham'86]
  - Find multiple shortest augmenting paths in one phase

## \* Augmenting Sets [CCLSSW'19]

$$\Pi_Q := (B_1, A_1, B_2, \dots, B_{k+1})$$

- |   |                               |
|---|-------------------------------|
| ① $A_R \subseteq D_{2R}$ , $B_R \subseteq D_{2R+1}$ | ④ $S + B_{k+1} \in I_2$       |
| ② $ B_1  =  A_1  = \dots =  B_{k+1} $               | ⑤ $S - A_R + B_{k+1} \in I_1$ |
| ③ $S + B_1 \in I_1$                                 | ⑥ $S - A_R + B_R \in I_2$     |



# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

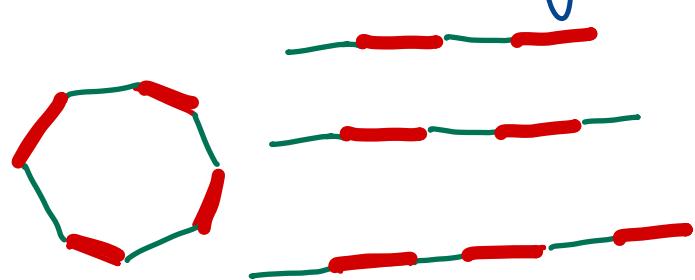
There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.



Let  $M^*$  be a maximum matching.

$\text{---} M$   
 $\text{---} M^*$



$M \Delta M^*$  can be decomposed into  
alternating paths of length 4 and alternating cycles

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

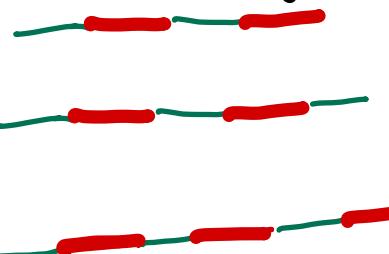
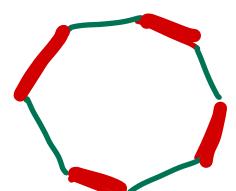
There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.



Let  $M^*$  be a maximum matching.

$\text{---} M$   
 $\text{---} M^*$



$M \Delta M^*$  can be decomposed into  
alternating paths of length 4 and alternating cycles

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

There is no augmenting path  
of length 4 in  $G(S)$   
 $\Rightarrow S$  is  $2/3$ -approx.

# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

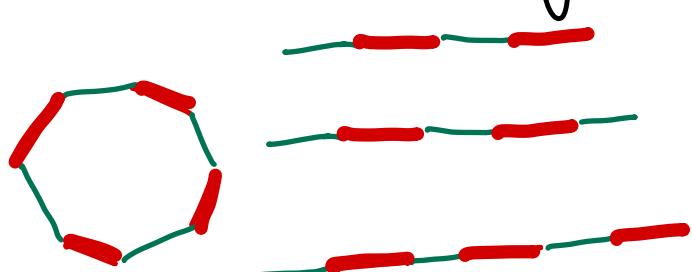
There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.



Let  $M^*$  be a maximum matching.

$\text{---} M$   
 $\text{---} M^*$



$M \Delta M^*$  can be decomposed into  
alternating paths of length 4 and alternating cycles

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

There is no augmenting path  
of length 4 in  $G(S)$   
 $\Rightarrow S$  is  $2/3$ -approx.

### key Observation

Terminate the algorithm of [Birkhoff]  
for finding augmenting sets of length 4  
early, after only  $O(1/\epsilon)$  phases

# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

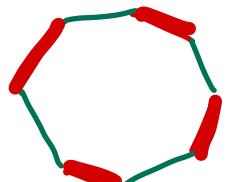
There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.



Let  $M^*$  be a maximum matching.

$\text{---} M$   
 $\text{---} M^*$



$M \Delta M^*$  can be decomposed into  
alternating paths of length 4 and alternating cycles

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

There is no augmenting path  
of length 4 in  $G(S)$   
 $\Rightarrow S$  is  $2/3$ -approx.

### key Observation

Terminate the algorithm of [Birkhoff]  
for finding augmenting sets of length 4  
early, after only  $O(1/\epsilon)$  phases

We can find almost all  
augmenting paths of length 4

# Idea: Analogy from (Bipartite) Matching

## (Bipartite) Matching

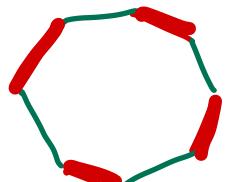
There is no augmenting path  
of length 3 in  $M$

$\Rightarrow M$  is a  $2/3$ -approx.



Let  $M^*$  be a maximum matching.

$\text{---} M$   
 $\text{---} M^*$



$M \Delta M^*$  can be decomposed into  
alternating paths of length 4 and alternating cycles

## Matroid Intersection

input:  $(U, I_1), (V, I_2)$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
find  $S \in I_1 \cap I_2$   
s.t.  $|S| \geq (\frac{2}{3} - \epsilon) \cdot r$   
using  $O(n/\epsilon + r \log r)$  queries

There is no augmenting path  
of length 4 in  $G(S)$   
 $\Rightarrow S$  is  $2/3$ -approx.

### key Observation

Terminate the algorithm of [Birkhoff]  
for finding augmenting sets of length 4  
early, after only  $O(1/\epsilon)$  phases

- We can find almost all  
augmenting paths of length 4
- $(2/3 - \epsilon)$ -approx.

## Unexpectedly Interesting Aspect of Our Result

Our algorithm can be extended to

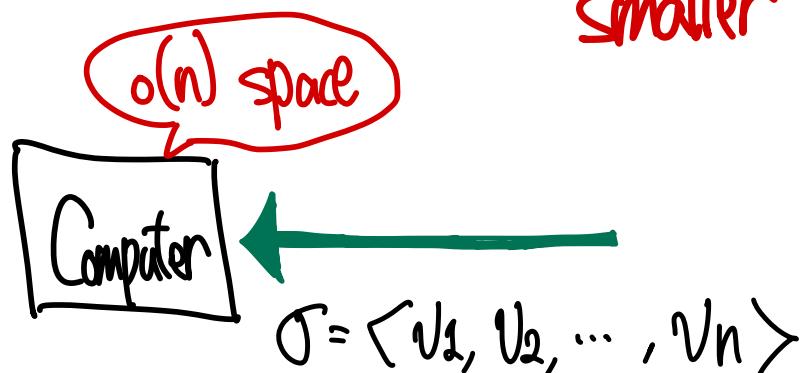
a Streaming Algo. !

# Unexpectedly Interesting Aspect of Our Result

Our algorithm can be extended to

a *Streaming Algo.* !

Solving the problem with space complexity  
smaller than the input size

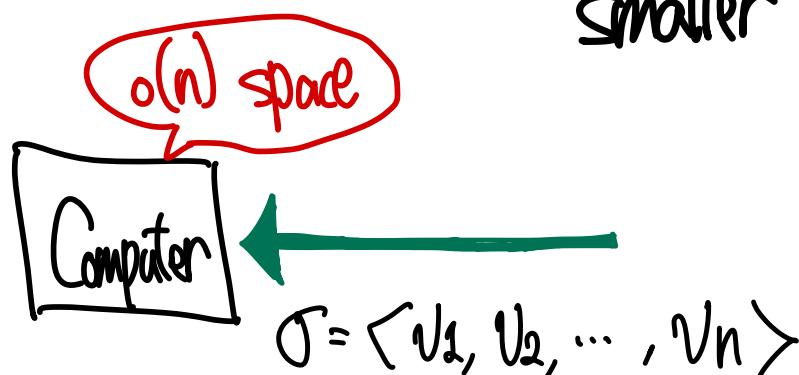


# Unexpectedly Interesting Aspect of Our Result

Our algorithm can be extended to

a *Streaming Algo.* !

Solving the problem with space complexity  
smaller than the input size



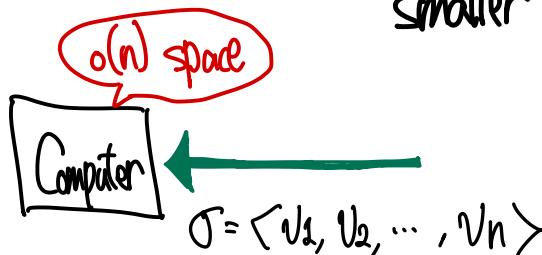
# of passes = How many times the algo. scans  
the entire input stream

# Unexpectedly Interesting Aspect of Our Result

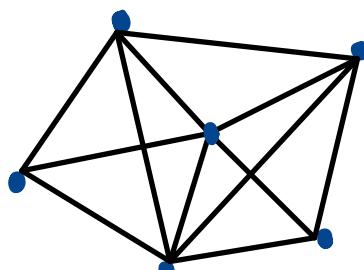
Our algorithm can be extended to

a *Streaming Algo.* !

Solving the problem with space complexity  
smaller than the input size



# of passes = How many times the algo. scans  
the entire input stream



- \* In particular, for graph problems, *Semi-Streaming Algo.*  
using  $O(\# \text{ of vertices})$  space are well studied!

# Streaming Algo. for Matroid Intersection

input :  $(U, I_1), (V, I_2)$   
 $\max |S| \text{ s.t. } S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $r_i := \max_{S \in I_i} |S| (i=1,2)$

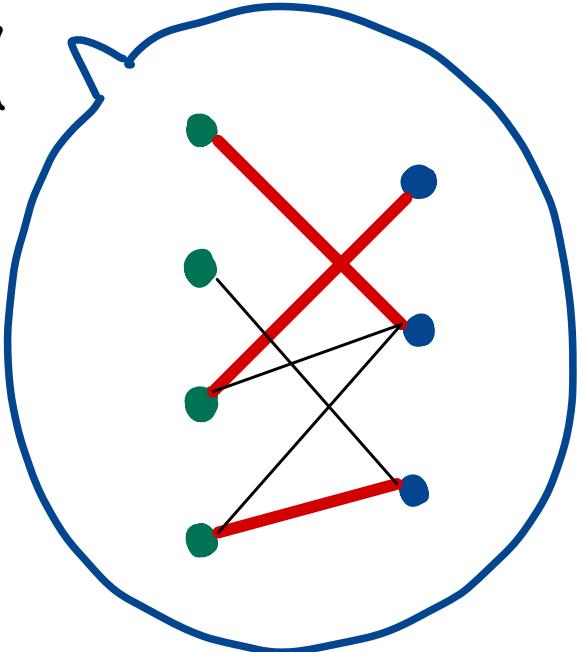
# Streaming Algo. for Matroid Intersection

input :  $(U, I_1), (V, I_2)$   
 $\max |S| \text{ s.t. } S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $r_i := \max_{S \in I_i} |S| (i=1,2)$

Semi-streaming algo. for  
matching

Paz-Schwartzman'17

Bernstein'20



# Streaming Algo. for Matroid Intersection

input :  $(U, I_1), (V, I_2)$   
 $\max |S| \text{ s.t. } S \in I_1 \cap I_2$   
 $n := |V|, r := \max_{S \in I_1 \cap I_2} |S|$   
 $r_i := \max_{S \in I_i} |S| (i=1,2)$

Semi-streaming algo. for  
matching  
Paz-Schwartzman'17

Generalization



Garg-Jordan-Svensson'21

1 pass, weighted,  $(1/2 - \epsilon)$ -approx.  $\tilde{\mathcal{O}}_\epsilon(r_1 + r_2)$  space



Huang-Sellier'24

1 pass, random-order,  $(2/3 - \epsilon)$ -approx.  $\tilde{\mathcal{O}}_\epsilon(r)$  space

Bernstein'20

# Streaming Algo. for Matroid Intersection

Semi-streaming algo. for matching  
Paz-Schwartzman'17

input :  $(U, I_1), (V, I_2)$   
max  $|S|$  s.t.  $S \in I_1 \cap I_2$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cap I_2} |S|$   
 $r_i := \max_{S \in I_i} |S| (i=1,2)$

Generalization



Garg-Jordan-Svensson'21

1 pass, weighted,  $(1/2 - \epsilon)$ -approx.  $\tilde{O}_\epsilon(r_1 + r_2)$  space



Huang-Sellier'24

1 pass, random-order,  $(2/3 - \epsilon)$ -approx.  $\tilde{O}_\epsilon(r)$  space

This work

$O(1/\epsilon)$  passes,  $(2/3 - \epsilon)$ -approx.,  $\tilde{O}(r_1 + r_2)$  space

# Streaming Algo. for Matroid Intersection

Semi-streaming algo. for matching

Paz-Schwartzman'17

Bernstein'20

Feigenbaum-Kannan-McGregor  
- Suri-Zhang '04

First streaming graph algo. paper

input :  $(U, I_1), (V, I_2)$   
max  $|S|$  s.t.  $S \in I_1 \cap I_2$   
 $n := |V|$ ,  $r := \max_{S \in I_1 \cap I_2} |S|$   
 $r_i := \max_{S \in I_i} |S| (i=1,2)$

Generalization



Garg-Jordan-Svensson'21

1 pass, weighted,  $(1/2 - \epsilon)$ -approx.  $\tilde{O}_\epsilon(r_1 + r_2)$  space



Huang-Sellier'24

1 pass, random-order,  $(2/3 - \epsilon)$ -approx.  $\tilde{O}_\epsilon(r)$  space



This work

$O(1/\epsilon)$  passes,  $(2/3 - \epsilon)$ -approx.,  $\tilde{O}(r_1 + r_2)$  space

# Conclusion

- Design  
a Deterministic  $(2/3 - \varepsilon)$ -approx.  $\tilde{O}(\varepsilon n)$  queries Algo.  
for Matroid Intersection
- Extending this to  
a  $O(1/\varepsilon)$  passes  $(2/3 - \varepsilon)$ -approx. Semi-Streaming Algo.  
(Generalization of FMZ'04)

# Conclusion

- Design  
a Deterministic  $(2/3 - \varepsilon)$ -approx.  $\tilde{O}_\varepsilon(n)$  queries Algo.  
for Matroid Intersection
- Extending this to  
a  $O(1/\varepsilon)$  passes  $(2/3 - \varepsilon)$ -approx. Semi-Streaming Algo.  
(Generalization of FKMZ'04)

## Open questions

- Deterministic  $(1 - \varepsilon)$ -approx.  $\tilde{O}_\varepsilon(n)$  queries Algo.
- $\text{poly}(1/\varepsilon)$  passes  $(1 - \varepsilon)$ -approx. Semi-Streaming Algo.