

# Simple dynamic algorithms for Maximal Independent Set, Maximum Flow and Maximum Matching

Manoj Gupta, Shahbaz Khan

Reading Group Algorithms

Antonis Skarlatos



# Outline of the paper

- ▷ Maximal Independent Set (MIS)
  - ▷ Fully dynamic under edge updates
  - ▷  $O(\min\{\Delta, m^{\frac{2}{3}}\})$  amortized update time
- ▷ Unit-Capacity Maximum Flow (UMF)
  - ▷ Incremental under edge updates
  - ▷  $O(n)$  amortized update time
- ▷ Maximum Cardinality Matching (MCM)
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# Maximal Independent Set (MIS)

## Definition of MIS

$G = (V, E)$ . A subset  $M \subseteq V$  is called a *maximal independent set* if and only if:

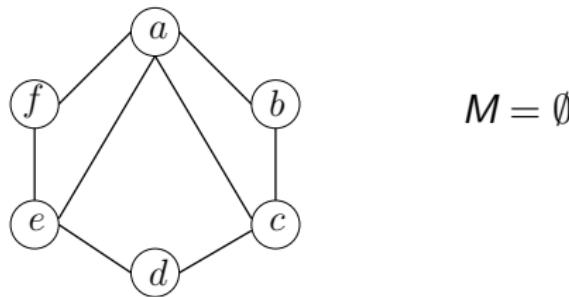
- ①  $\forall u, w \in M$ : no edge between them
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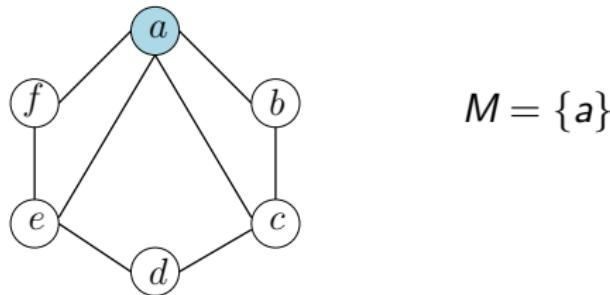


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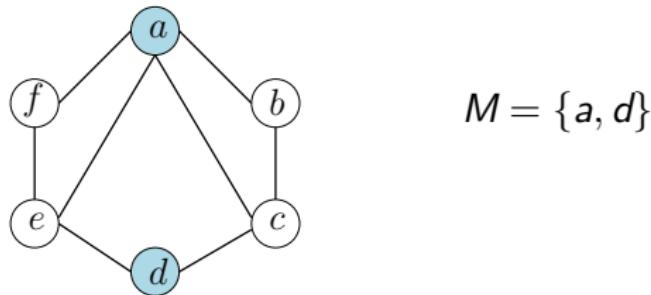


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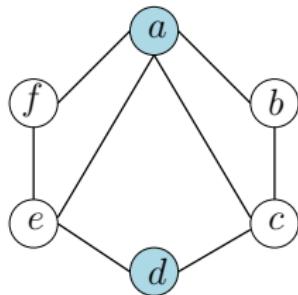


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$$M = \{a, d\}$$

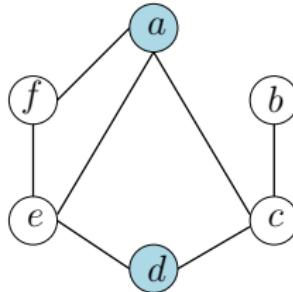
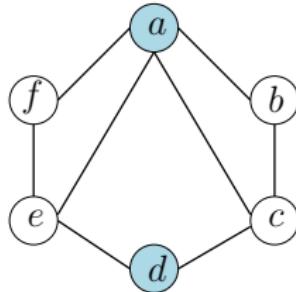
DFS/BFS:  $O(n + m)$

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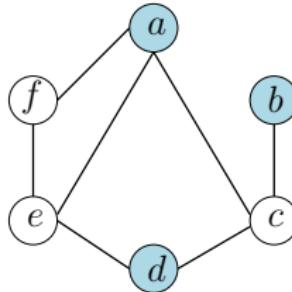
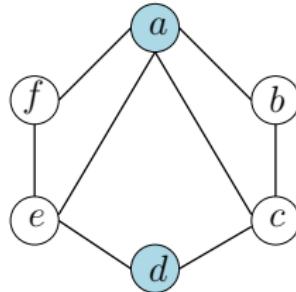


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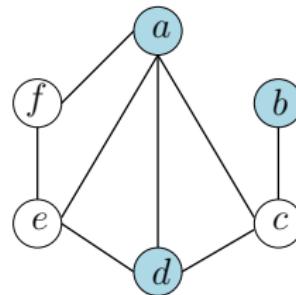
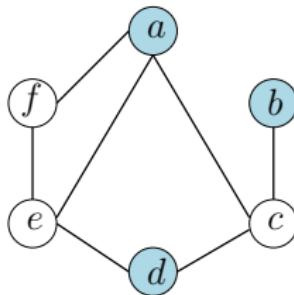
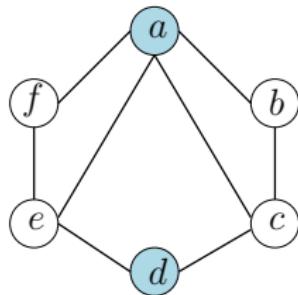


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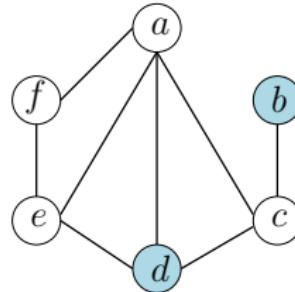
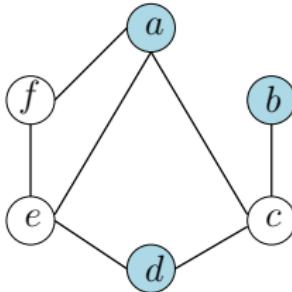
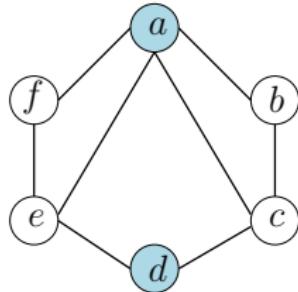


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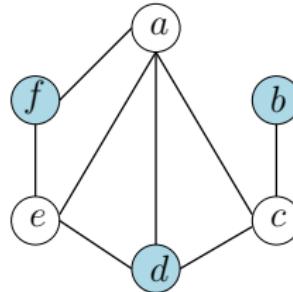
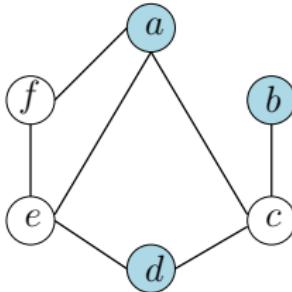
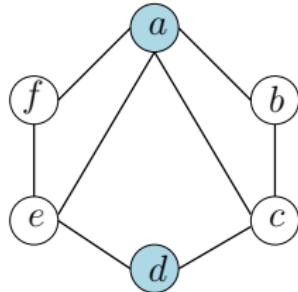


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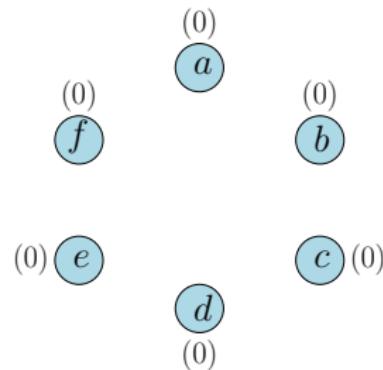
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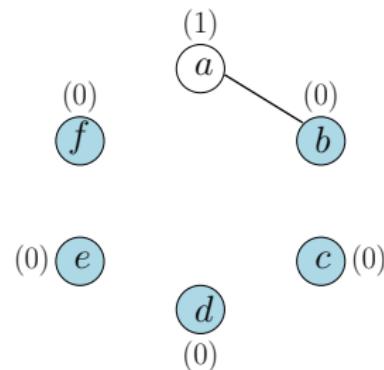
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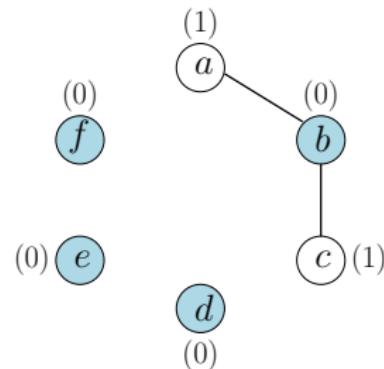
# Algorithm with counters



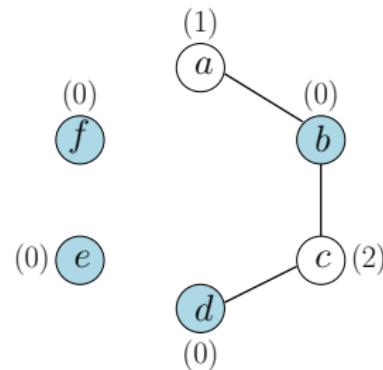
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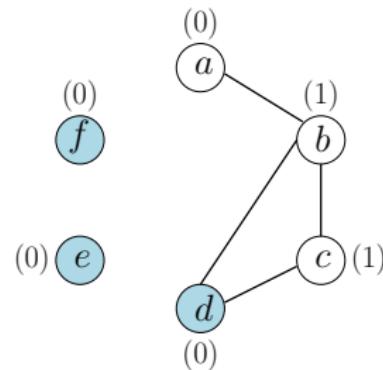
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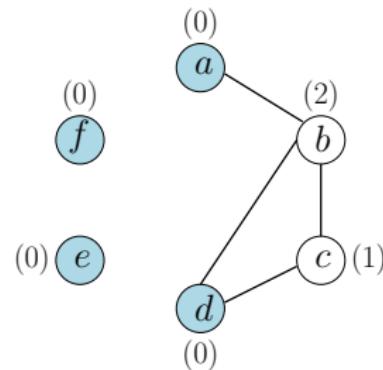
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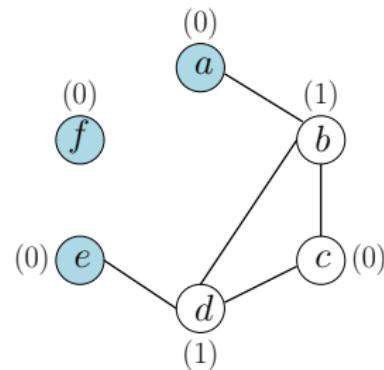
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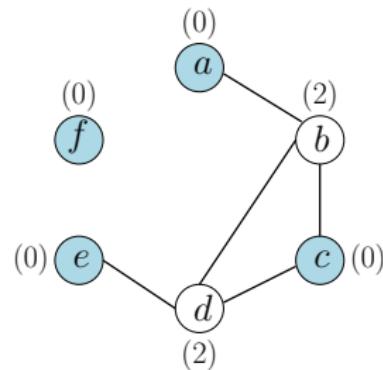
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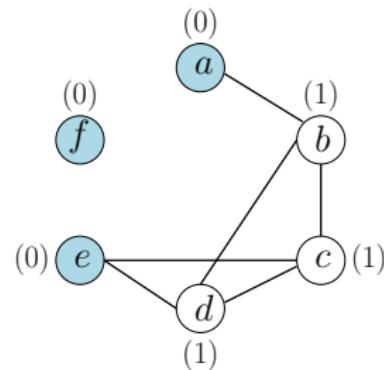
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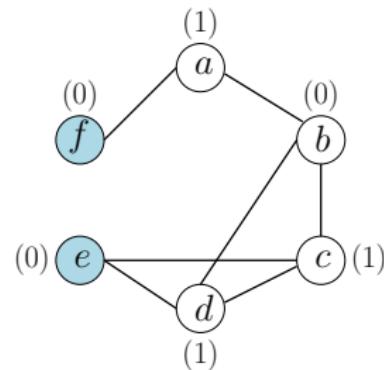
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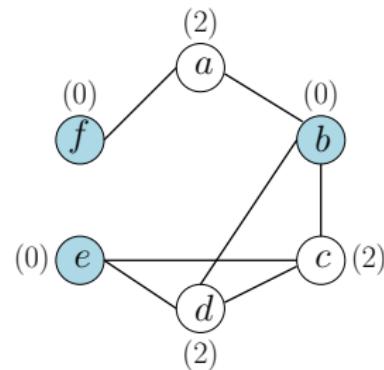
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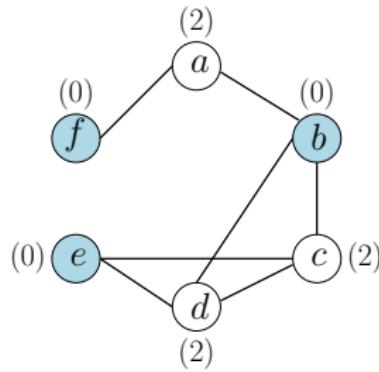
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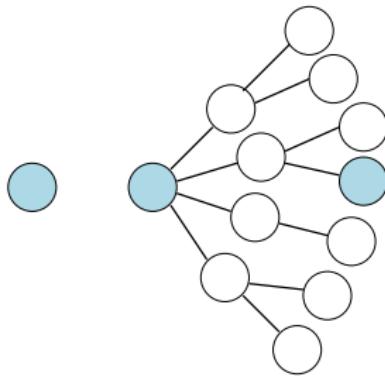
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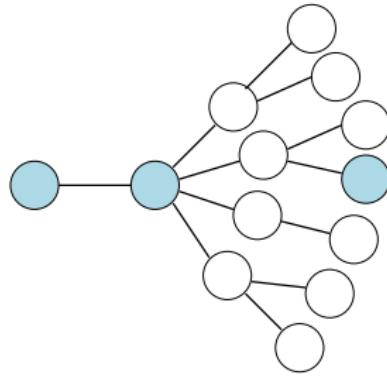
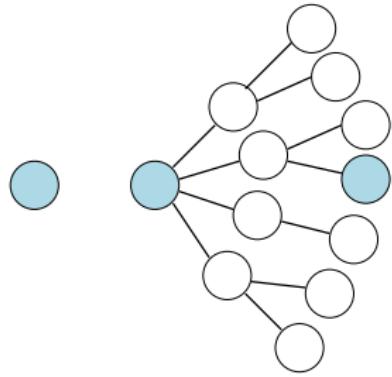
Edge deletion: one vertex may be added to MIS

Edge insertion: one vertex may be removed from MIS  
multiple vertices may be added to MIS

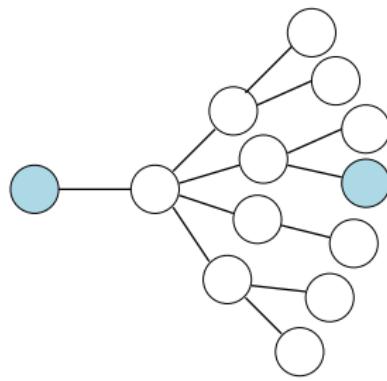
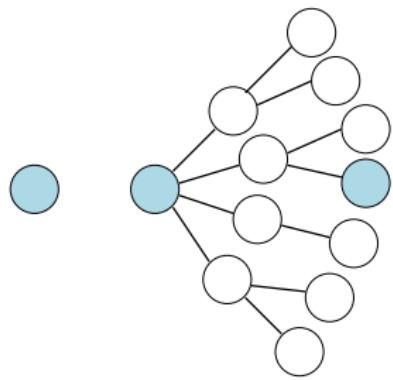
# Difficult Case



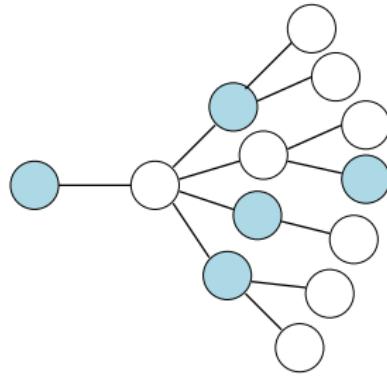
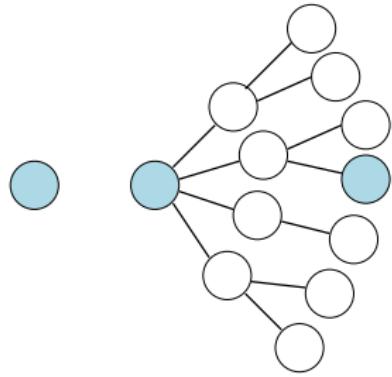
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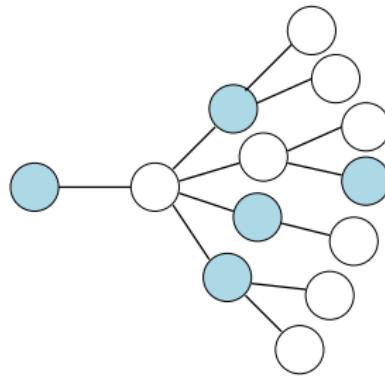
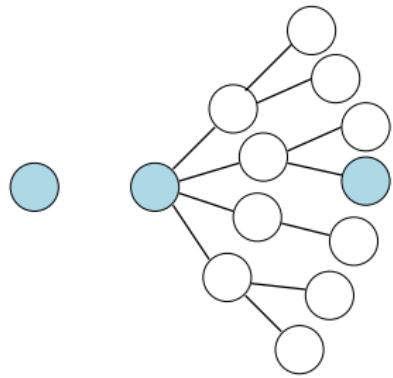
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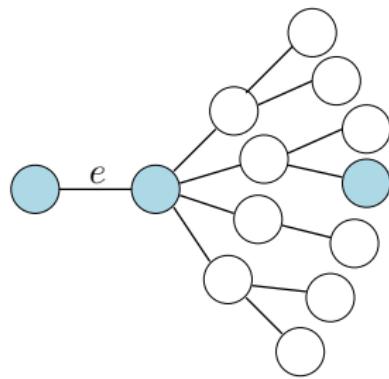


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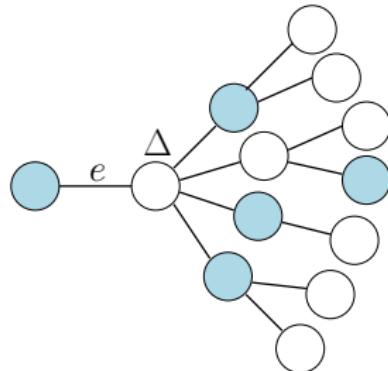


$O(\Delta^2)$  worst-case time

$O(\Delta)$  amortized update time

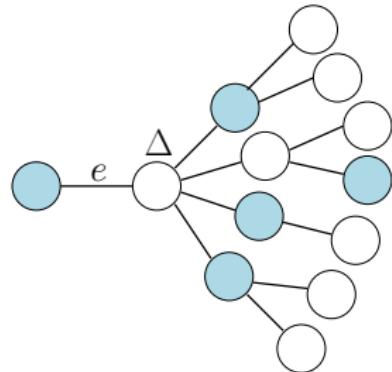


$O(\Delta)$  amortized update time



- ① At most one vertex may be removed from MIS
- ② A vertex iterates over its neighborhood only if enters/leaves MIS

# $O(\Delta)$ amortized update time



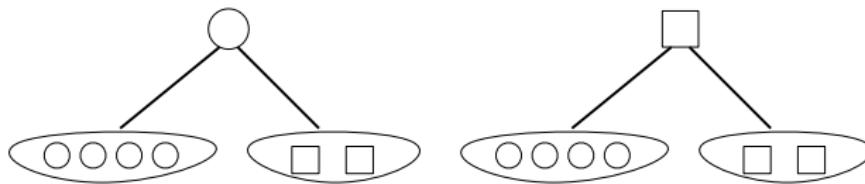
	$e_1$	$e_2$	$e_3$	$e_4$	$e_5$
$-a$		$-b$		$-c$	
			$+a$	$+c$	
				$+b$	

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# Heavy/Light separation

$$L = \{u \in V(G) \mid \deg(u) \leq \alpha\}$$

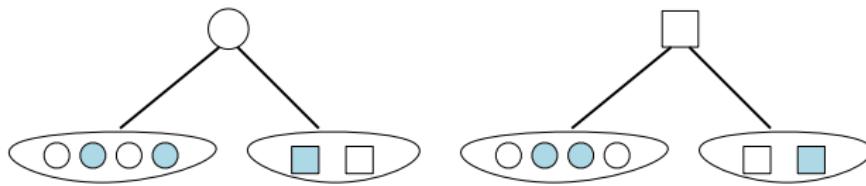
$$H = \{u \in V(G) \mid \deg(u) > \alpha\}$$



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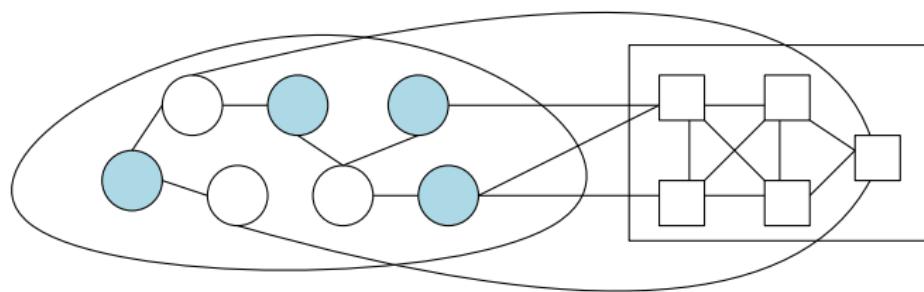
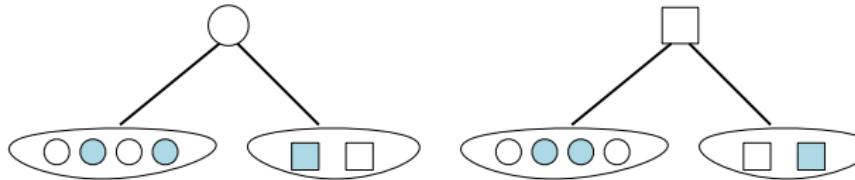
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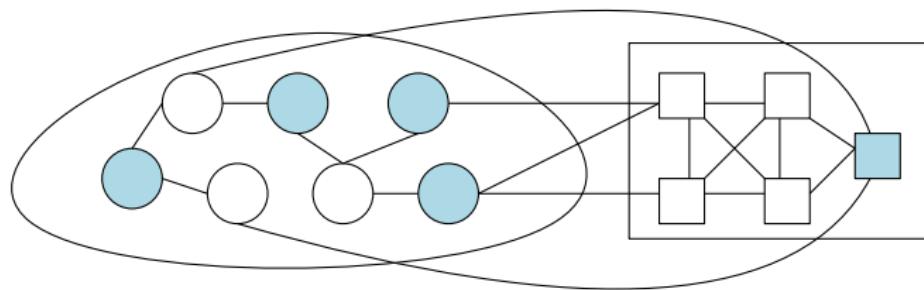
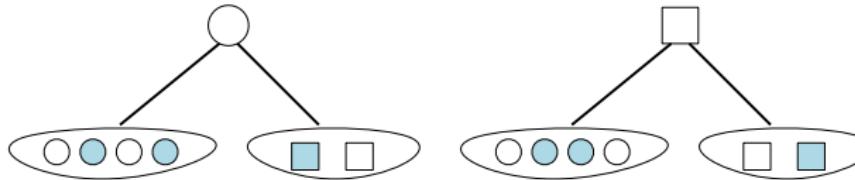
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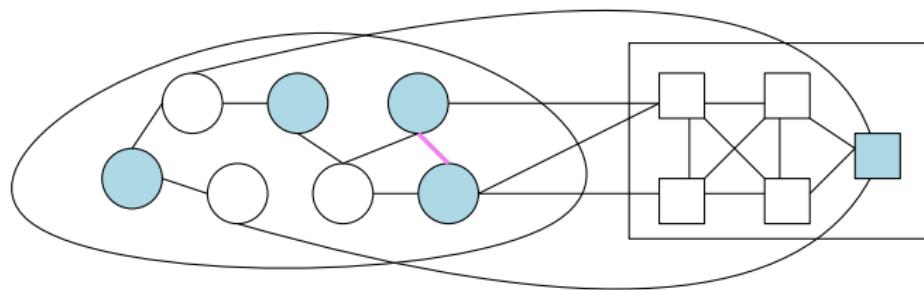
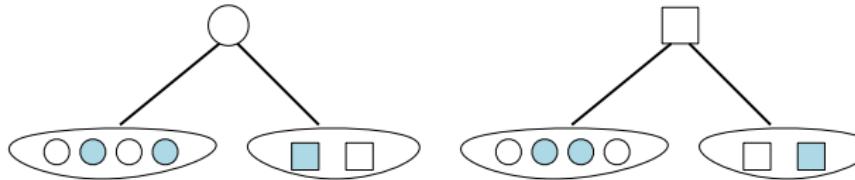
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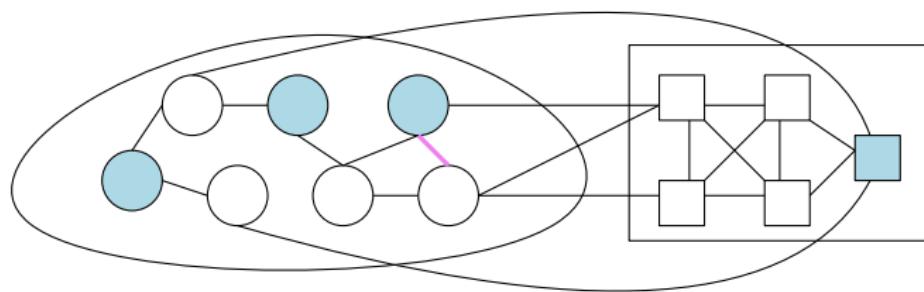
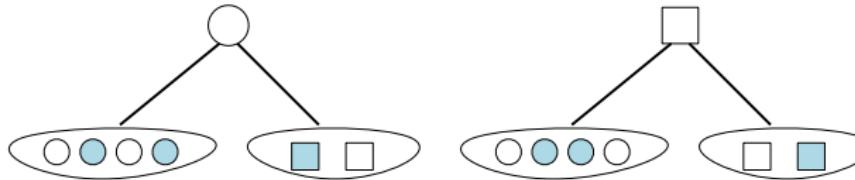
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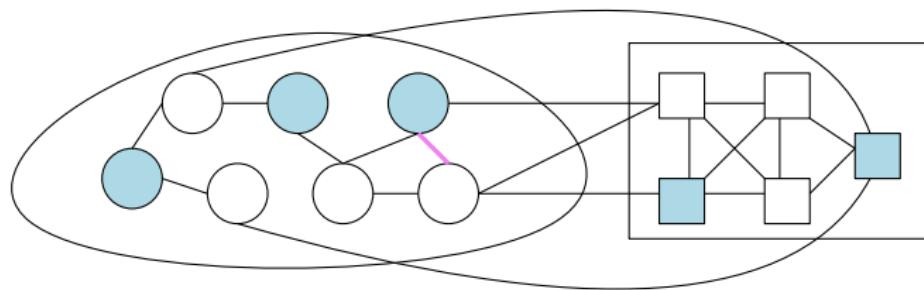
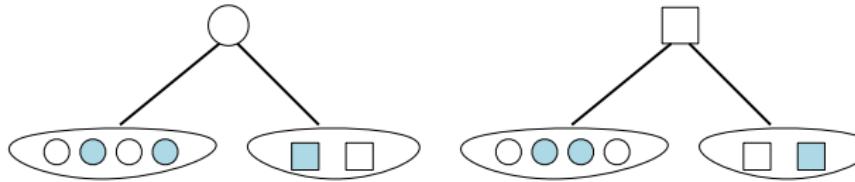
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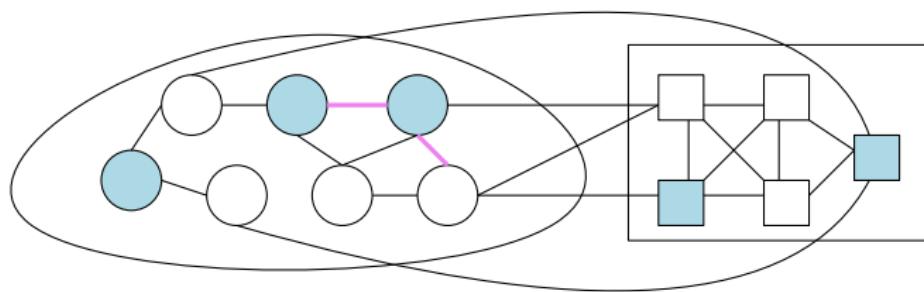
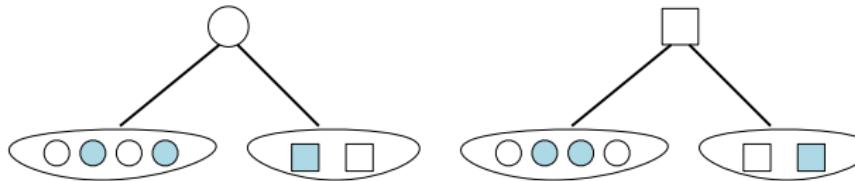
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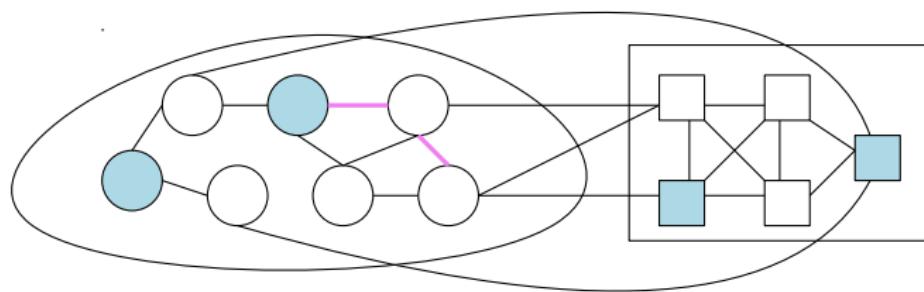
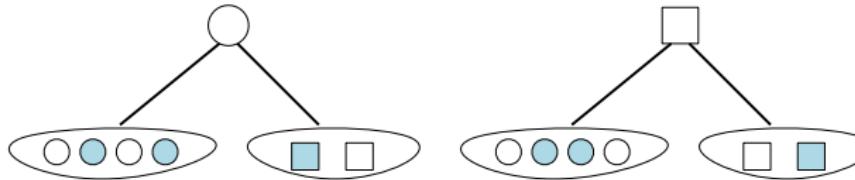
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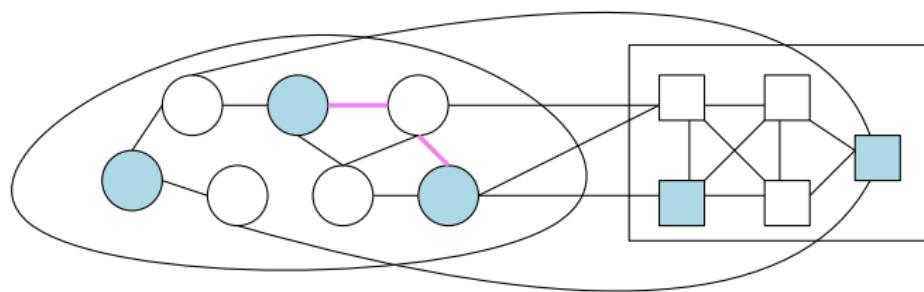
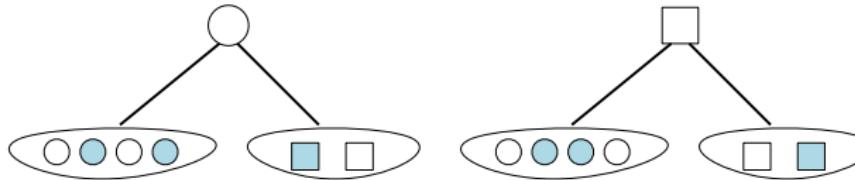
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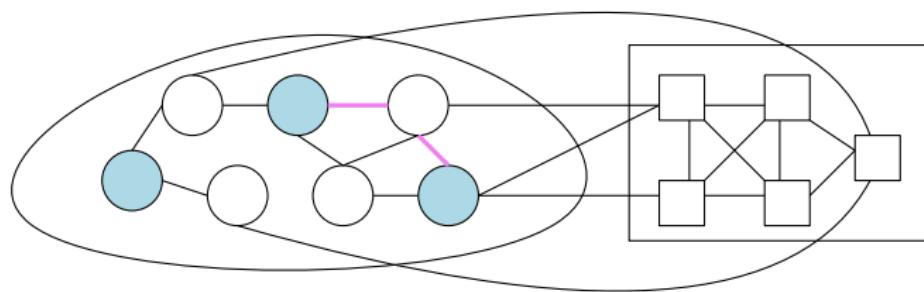
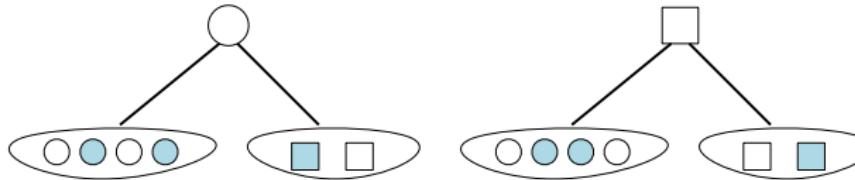
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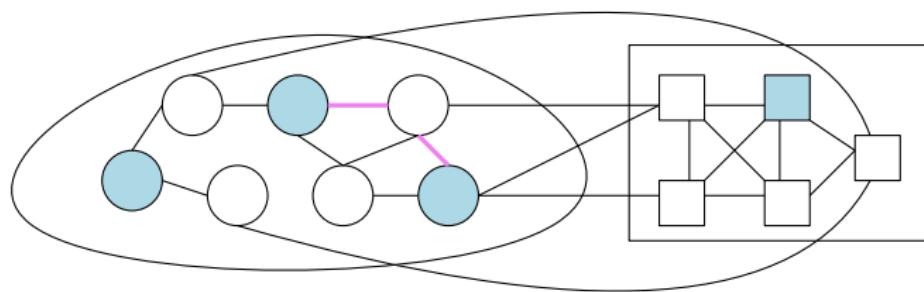
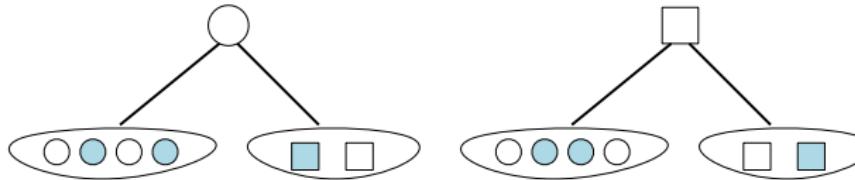
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# Heavy/Light separation

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$$H = \{u \in V(G) \mid \deg(u) > \alpha\}$$



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Heavy vertices do not inform their light neighborhood

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*Thank you !*

- [1] Assadi et. al. "Fully dynamic maximal independent set with sublinear in n update time". **in 2019.**
- [2] Manoj Gupta and Shahbaz Khan. "Simple dynamic algorithms for Maximal Independent Set, Maximum Flow and Maximum Matching". **in 2021.**