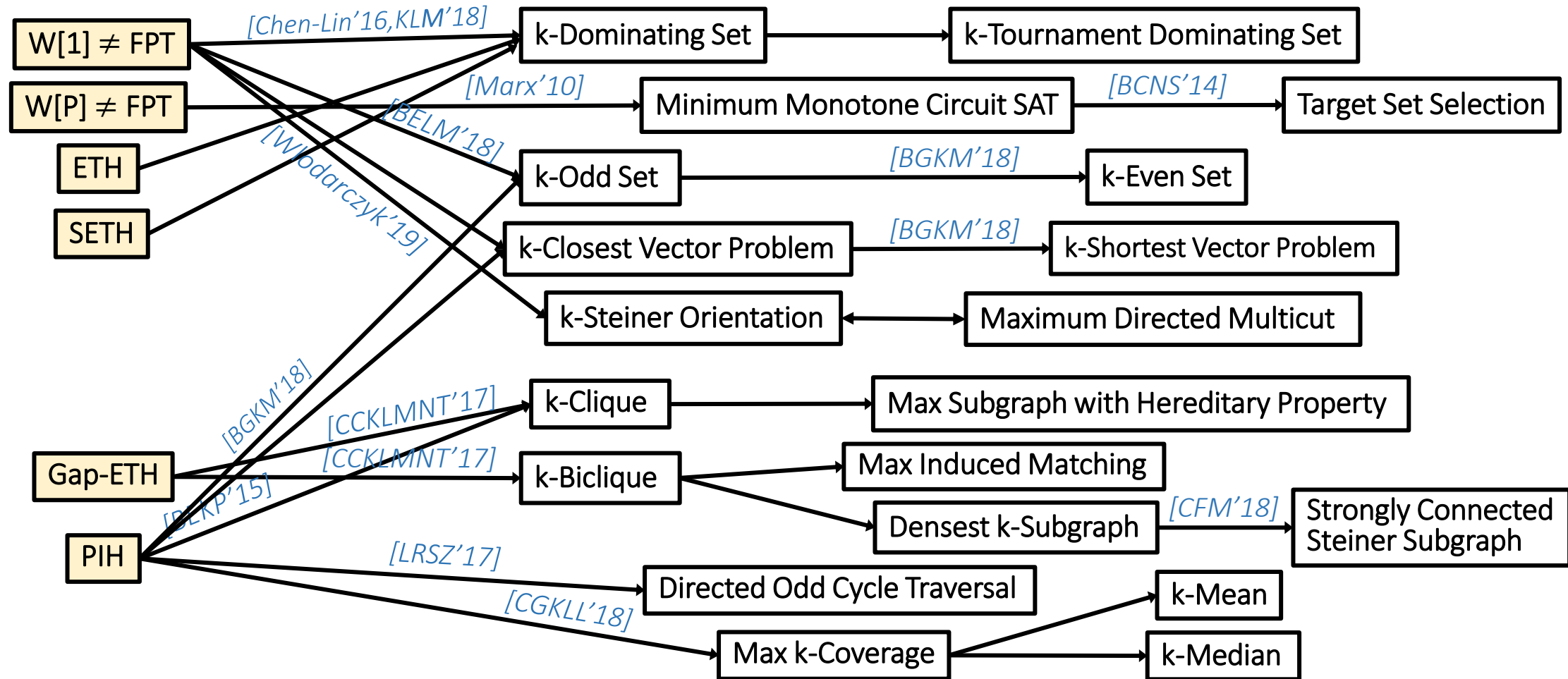


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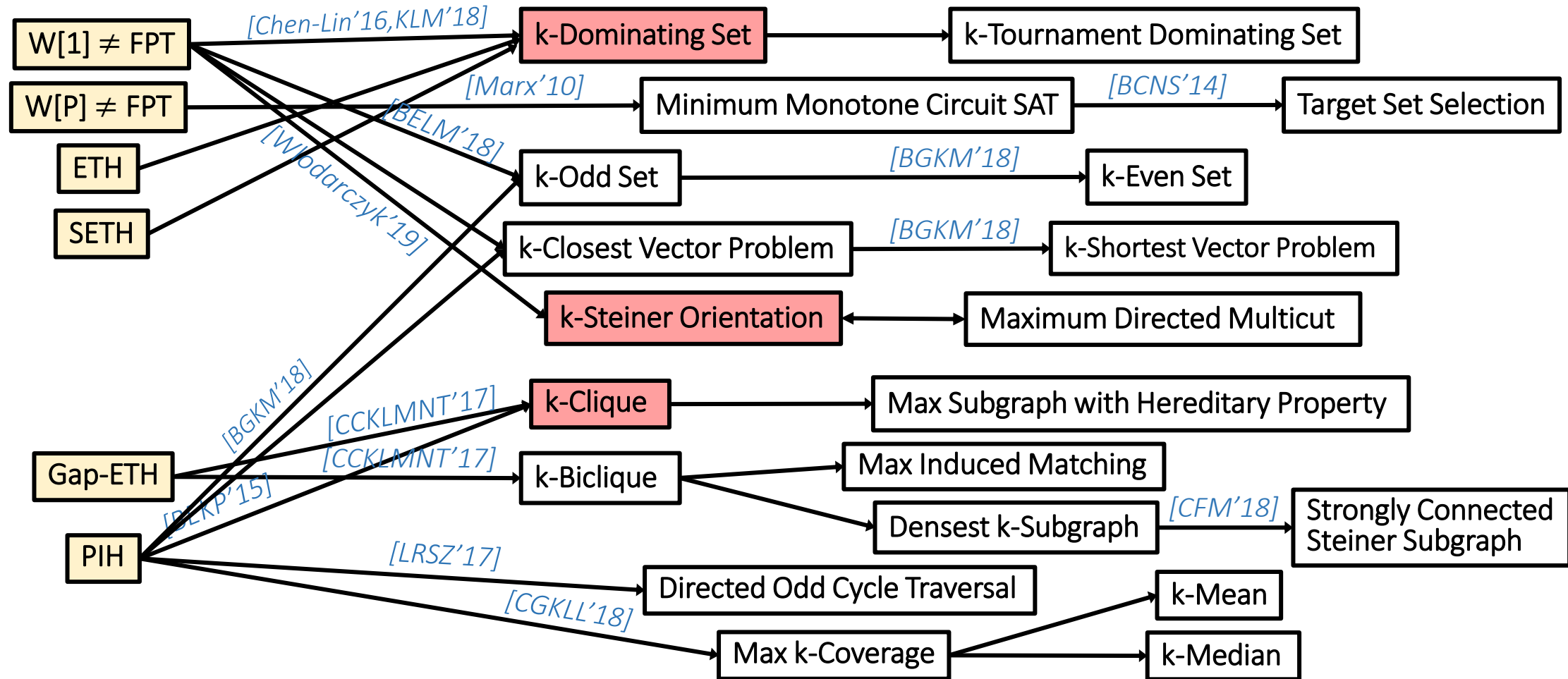
# Parameterized Inapproximability

Pasin Manurangsi  
Google Research

# Parameterized Inapproximability: *Recent Developments*



# Parameterized Inapproximability: *Recent Developments*

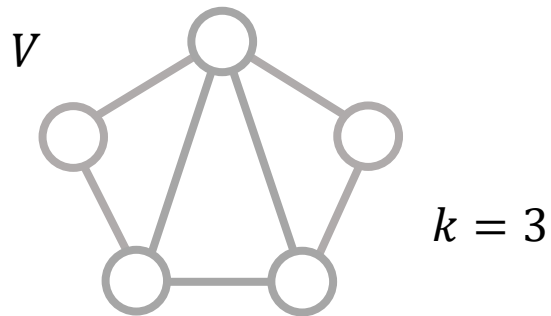


# Parameterized Complexity: *A Brief Introduction*

## $k$ -Clique

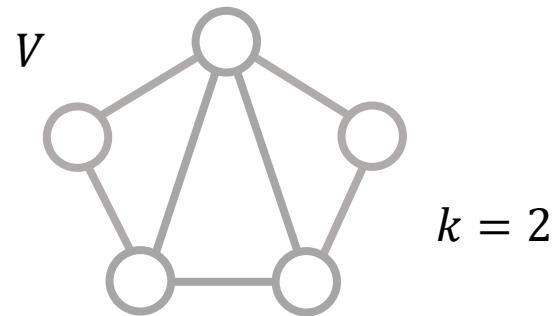
**Input:** Graph  $G = (V, E)$ , integer  $k$

**Output:** A subset  $S \subseteq V$  of size  $k$  that induces a clique



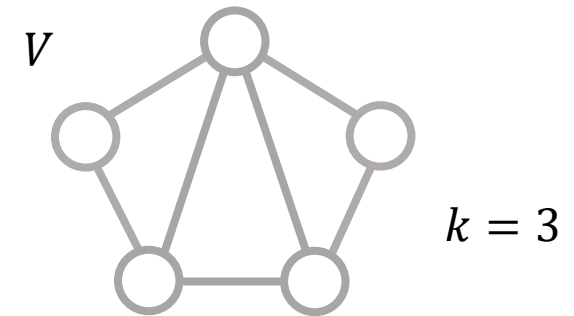
## $k$ -Dominating Set

**Input:** Graph  $G = (V, E)$ , integer  $k$



## $k$ -Vertex Cover

**Input:** Graph  $G = (V, E)$ , integer  $k$

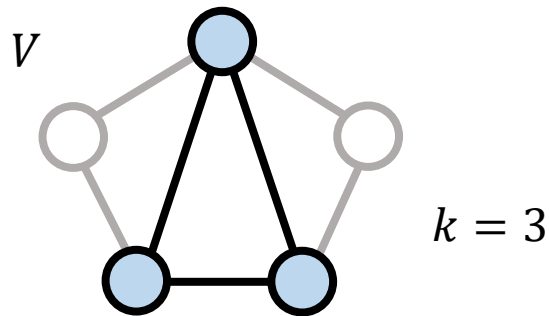


# Parameterized Complexity: *A Brief Introduction*

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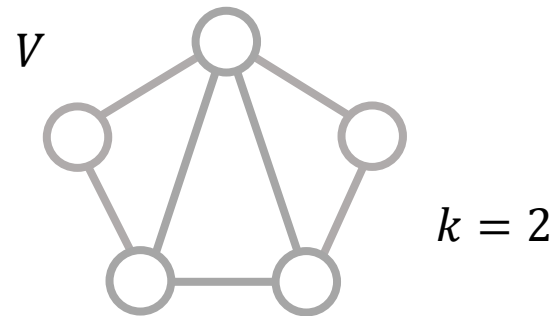
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## $k$ -Dominating Set

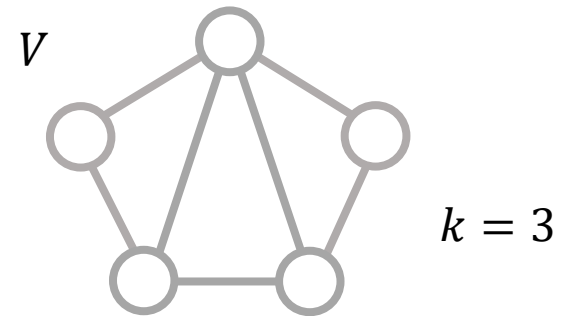
**Input:** Graph  $G = (V, E)$ , integer  $k$

**Output:** A subset  $S \subseteq V$  of size  $k$  such that  $S \cup N(S) = V$



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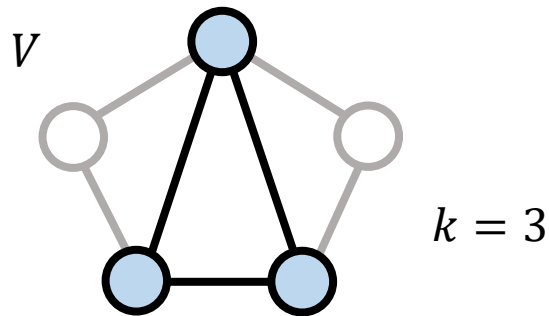


# Parameterized Complexity: *A Brief Introduction*

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**Input:** Graph  $G = (V, E)$ , integer  $k$

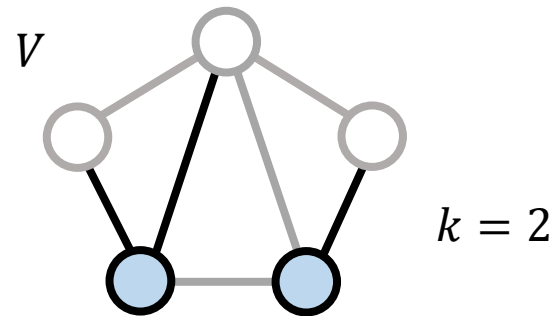
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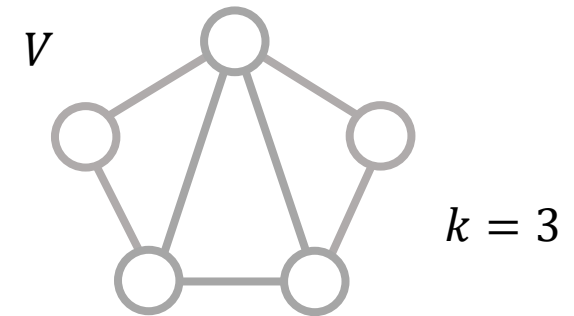
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## $k$ -Vertex Cover

**Input:** Graph  $G = (V, E)$ , integer  $k$

**Output:** A subset  $S \subseteq V$  of size  $k$  that covers all edges

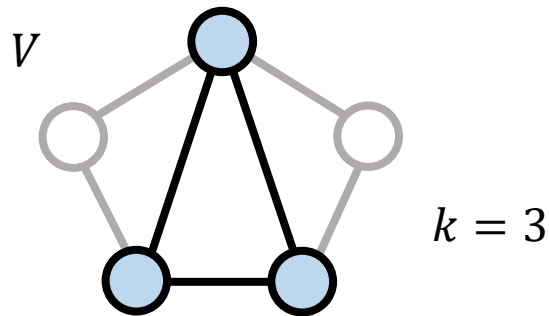


# Parameterized Complexity: A *Brief Introduction*

## $k$ -Clique

Input: Graph  $G = (V, E)$ , integer  $k$

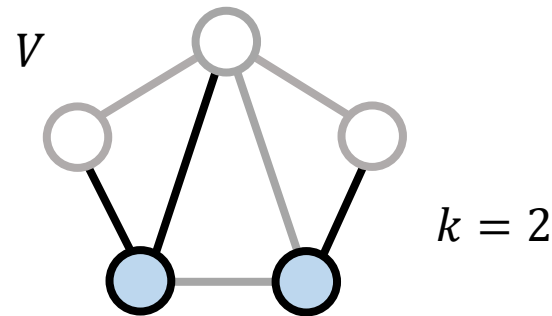
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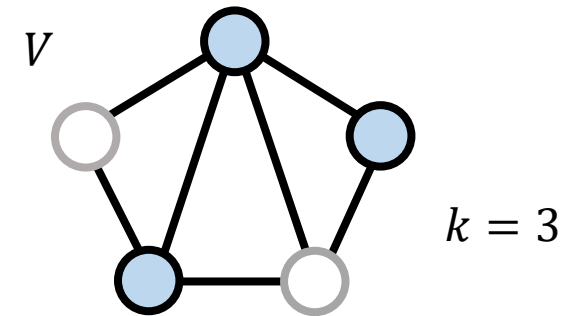
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## $k$ -Vertex Cover

Input: Graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that covers all edges



Is there any poly time algo for the problems?

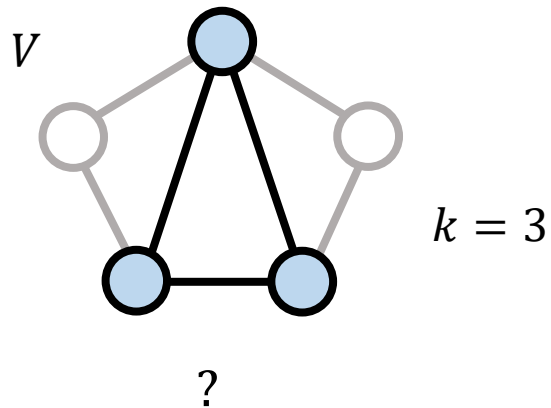
Unlikely: all are *NP*-complete [Karp'72]

# Parameterized Complexity: A Brief Introduction

## $k$ -Clique

Input: Graph  $G = (V, E)$ , integer  $k$

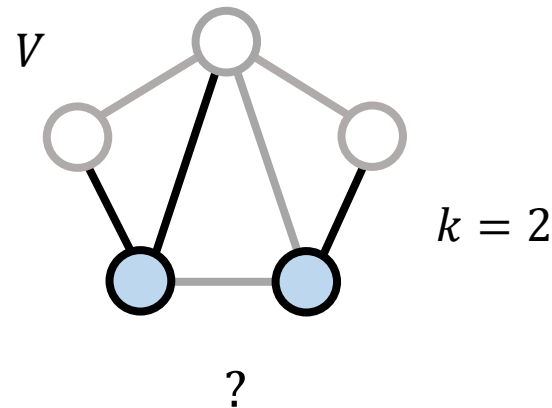
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## $k$ -Dominating Set

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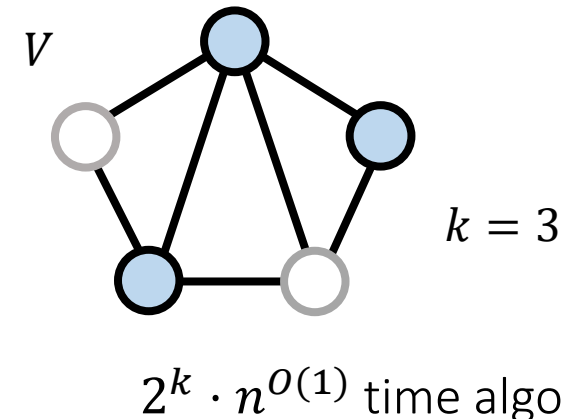
Output: A subset  $S \subseteq V$  of size  $k$  such that  $S \cup N(S) = V$



## $k$ -Vertex Cover *Parameter*

Input: Graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that covers all edges



Enumeration Algorithm:  $n^{O(k)}$  time

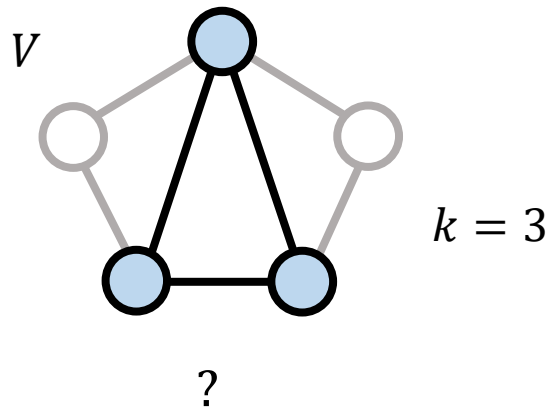


# Parameterized Complexity: A Brief Introduction

## $k$ -Clique

Input: Graph  $G = (V, E)$ , integer  $k$

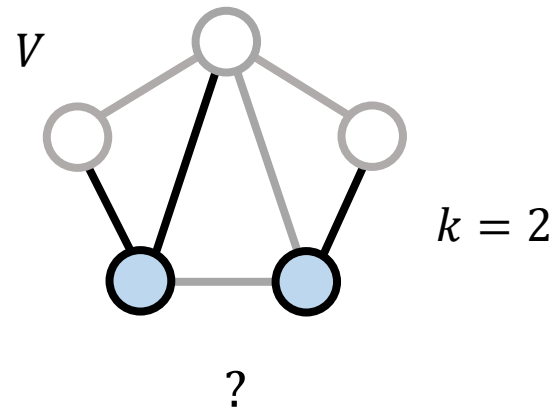
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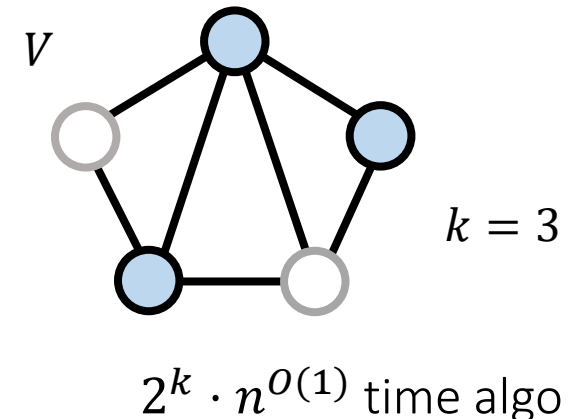
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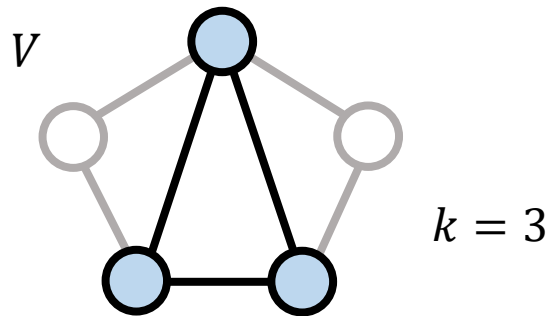
FPT Algo:  $f(k)n^{O(1)}$ -time for some function  $f$

# Parameterized Complexity: A Brief Introduction

## $k$ -Clique

Input: Graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that induces a clique

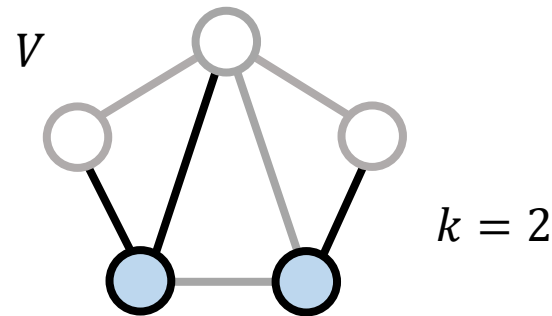


[Downey-Fellows'92] W[1]-complete

## $k$ -Dominating Set

Input: Graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  such that  $S \cup N(S) = V$

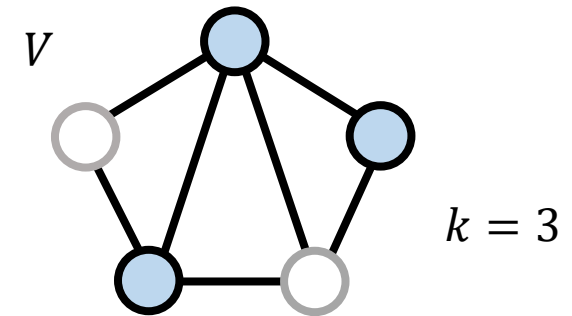


[Downey-Fellows'92] W[2]-complete

## $k$ -Vertex Cover Parameter

Input: Graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that covers all edges



$2^k \cdot n^{O(1)}$  time algo

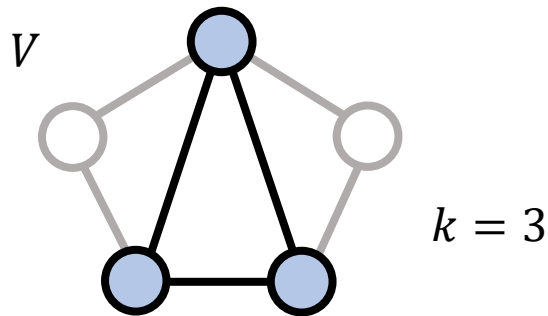
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# Parameterized Complexity: A *Brief Introduction*

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that induces a clique

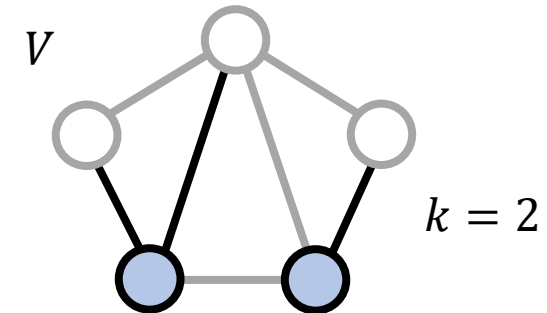


[Downey-Fellows'92]  $k$ -Clique is  $W[1]$ -complete

## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  such that  $S \cup N(S) = V$



[Downey-Fellows'92]  $k$ -DomSet is  $W[2]$ -complete

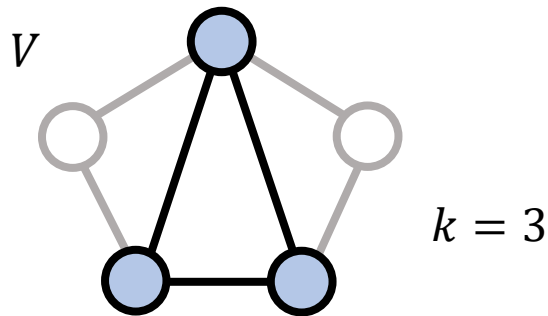
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# Parameterized *Approximation*

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k$  that induces a clique



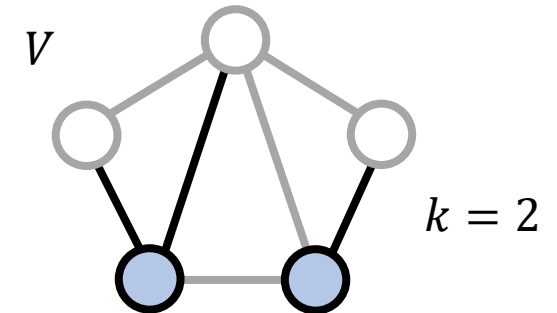
Parameter



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Parameter

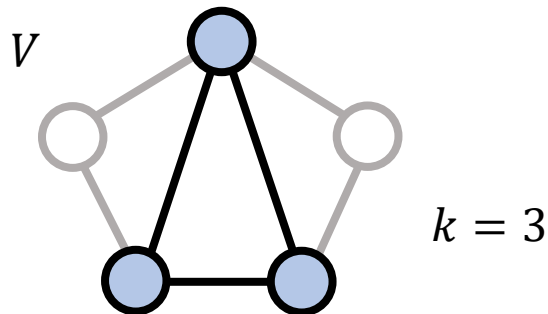


FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{O(1)}$ -time for some function  $f, g$

# Parameterized *Approximation*

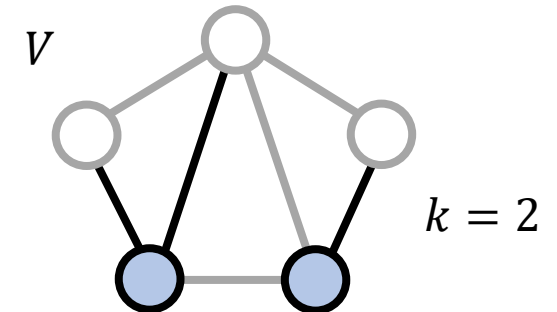
## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$   
Output: A subset  $S \subseteq V$  of size  $k/g(k)$  that induces a clique



## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$   
Output: A subset  $S \subseteq V$  of size  $k$  such that  $S \cup N(S) = V$



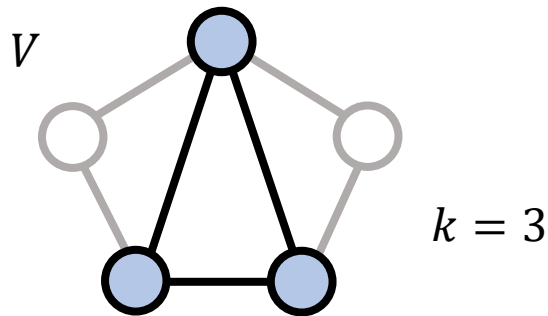
FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{O(1)}$ -time for some function  $f, g$

# Parameterized *Approximation*

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k/g(k)$  that induces a clique

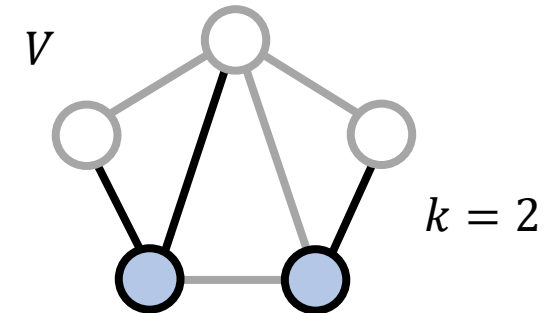


Is there 1.1-FPT-approx. algo?

## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k \cdot g(k)$  such that  $S \cup N(S) = V$



Is there 1.1-FPT-approx. algo?

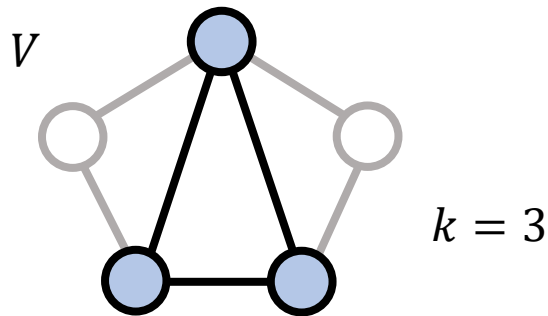
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# Parameterized *Approximation*

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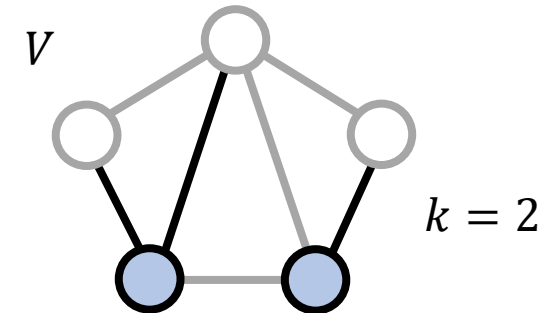


Is there  $o(k)$ -FPT-approx. algo?

## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$

Output: A subset  $S \subseteq V$  of size  $k \cdot g(k)$  such that  $S \cup N(S) = V$



Is there 1.1-FPT-approx. algo?

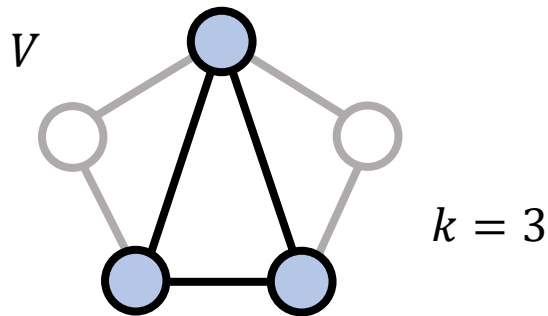
FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{O(1)}$ -time for some function  $f, g$

# Parameterized *Approximation*

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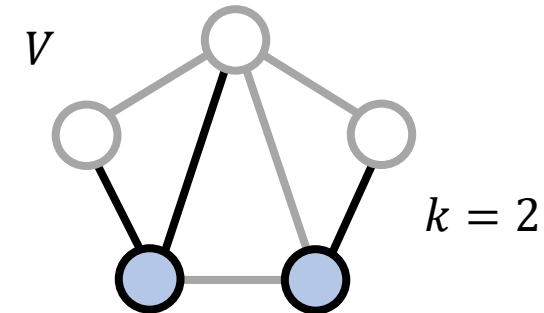


Is there  $o(k)$ -FPT-approx. algo?

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Input: A graph  $G = (V, E)$ , integer  $k$

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Is there  $g(k)$ -FPT-approx. algo for any  $g$ ?

FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{O(1)}$ -time for some function  $f, g$



# Complexity Assumptions

## Exponential Time Hypotheses

**Exponential time Hypothesis (ETH)** [Impagliazzo, Paturi'01]  
No  $2^{o(n)}$ -time algo can decide whether a 3CNF formula is satisfiable

**Strong ETH (SETH)** [Impagliazzo, Paturi'01]  
For any constant  $\varepsilon > 0$ , no  $O(2^{(1-\varepsilon)n})$ -time algorithm can decide whether a CNF formula is satisfiable

**Gap ETH (Gap-ETH)** [Dinur'16] [M, Raghavendra'16]  
For some constant  $\delta > 0$ , no  $2^{o(n)}$ -time algorithm can distinguish between a satisfiable CNF formula and one which is not even  $(1 - \delta)$ -satisfiable.

## Parameterized Complexity

**W[1]  $\neq$  FPT Assumption** [Downey, Fellows'92]  
For any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can decide whether a given graph contains a  $k$ -clique

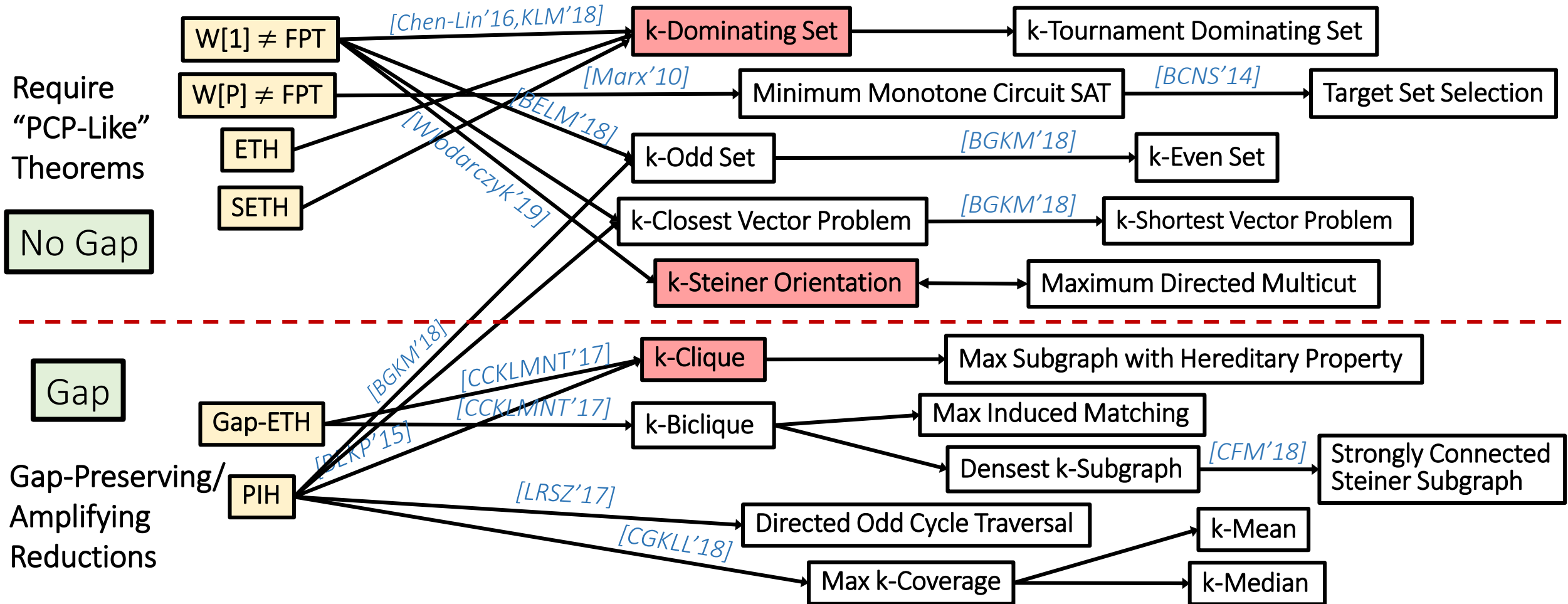
**W[2]  $\neq$  FPT Assumption** [Downey, Fellows'92]  
For any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can decide whether a given graph contains a dominating set of size  $k$

**Parameterized Inapproximability Hypothesis (PIH)** [Lokshtanov, Ramanujan, Saurabh, Zehavi'17]  
For some  $\delta > 0$  and any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can distinguish between a satisfiable 2CSP instance with  $k$  variables and alphabet size  $n$  and one which is not even  $(1 - \delta)$ -satisfiable.

No Gap

Gap

# Parameterized Inapproximability: *Recent Developments*



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# Part I: Clique

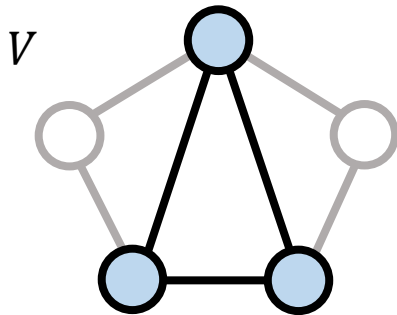
# Parameterized Inapproximability

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $k$   
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FPT Algo:  $f(k)n^{O(1)}$ -time for some function  $f$

[\[Downey-Fellows'92\]](#)  $k$ -Clique is W[1]-complete

[\[Chen-Chor-Fellows-Huang-Juedes-Kanj-Xia'05\]](#)

ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Clique

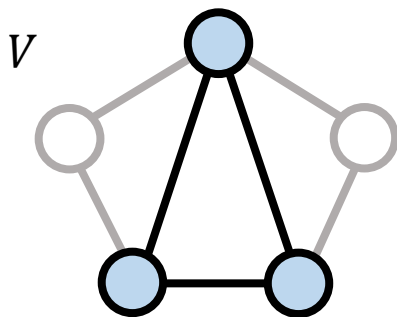
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Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $k/g(k)$  that induces a clique



FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{o(1)}$ -time  
for some function  $f, g$

[Downey-Fellows'92]  $k$ -Clique is W[1]-complete

[Chen-Chor-Fellows-Huang-Juedes-Kanj-Xia'05]

ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Clique

[Bonnet-Escoffier-Kim-Paschos'15]

Gap-ETH  $\Rightarrow$  no constant factor FPT approx algo for  $k$ -Clique

[Chalermsook-Cygan-Kortsarz-Laekhanukit-M-Nanongkai-Trevisan'17]

Gap-ETH  $\Rightarrow$  no  $g(k)$ -approx  $f(k)n^{o(k/g(k))}$ -time algo  
for  $k$ -Clique for any  $g = o(k)$

## Inherently Enumerative

There exists  $\delta > 0$  such that for any sufficiently large  $k < r$ , no  $O(n^{\delta k})$ -time algo can distinguish between

- $\text{Clique}(G) \leq k$
- $\text{Clique}(G) \geq r$

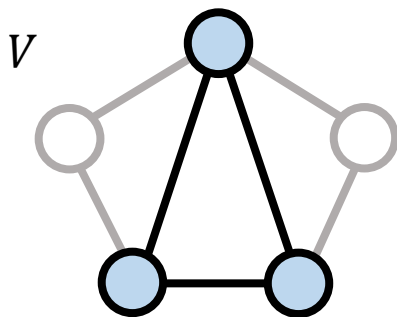
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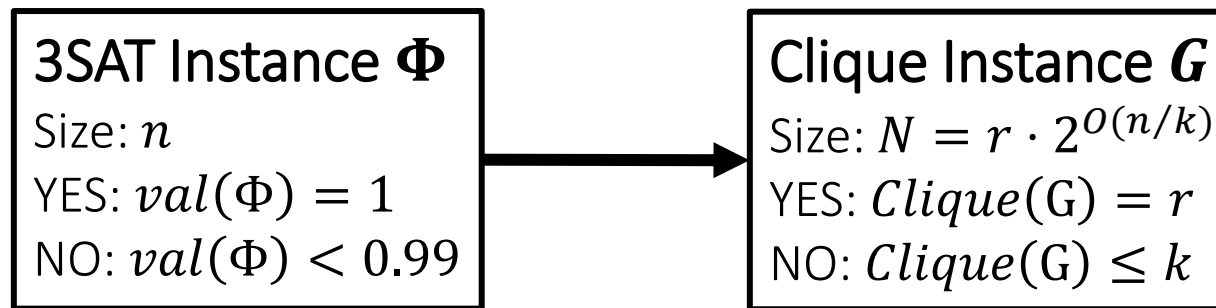
Gap-ETH  $\Rightarrow$  no  $g(k)$ -approx  $f(k)n^{o(k/g(k))}$ -time algo  
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There exists  $\delta > 0$  such that for any sufficiently large  $k < r$ , no  $O(n^{\delta k})$ -time algo can distinguish between

- $\text{Clique}(G) \leq k$
- $\text{Clique}(G) \geq r$

# Proof Sketch: *Inherently Enumerability of $k$ -Clique*



Lower Bound:  $2^{\Omega(n)}$

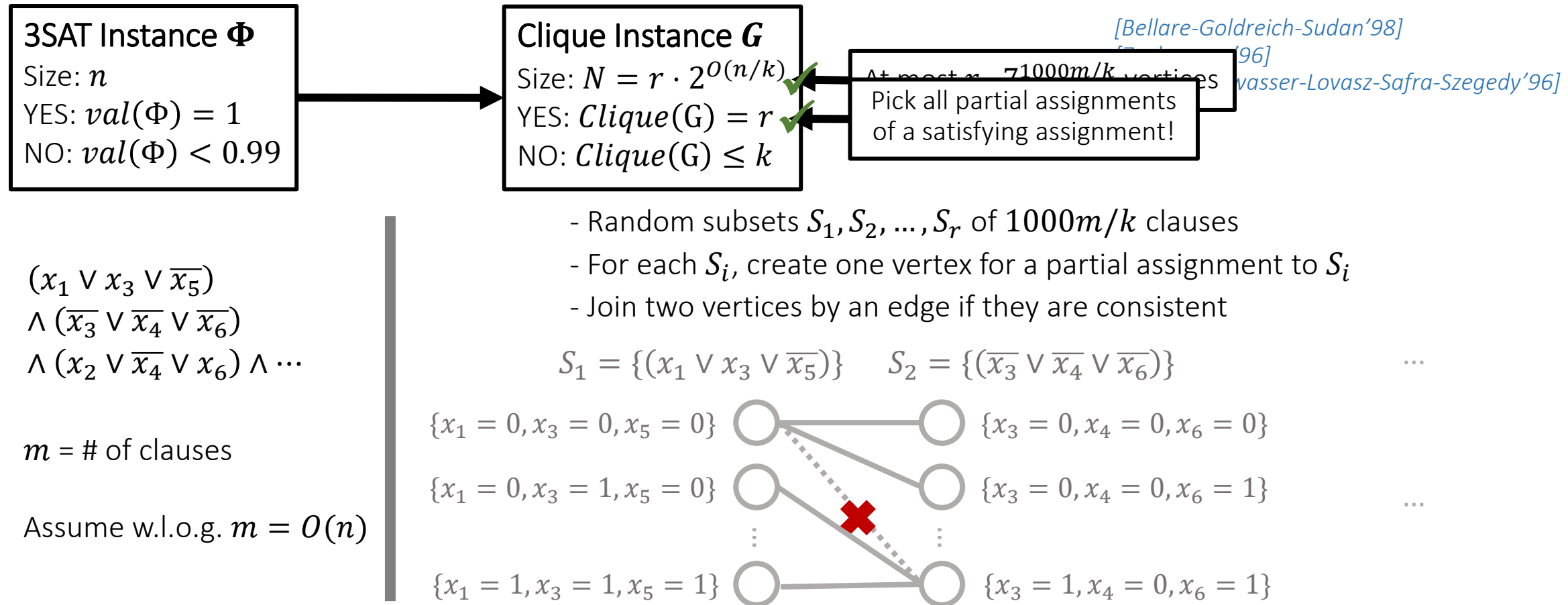
Lower Bound:  $N^{\Omega(k)}$

## GOAL

Assuming Gap-ETH, there exists  $\delta > 0$  such that for any sufficiently large  $k < r$ , no  $O(N^{\delta k})$ -time algo can distinguish between

- $Clique(G) \leq k$
- $Clique(G) \geq r$

# Proof Sketch: *Inherently Enumerability of $k$ -Clique*

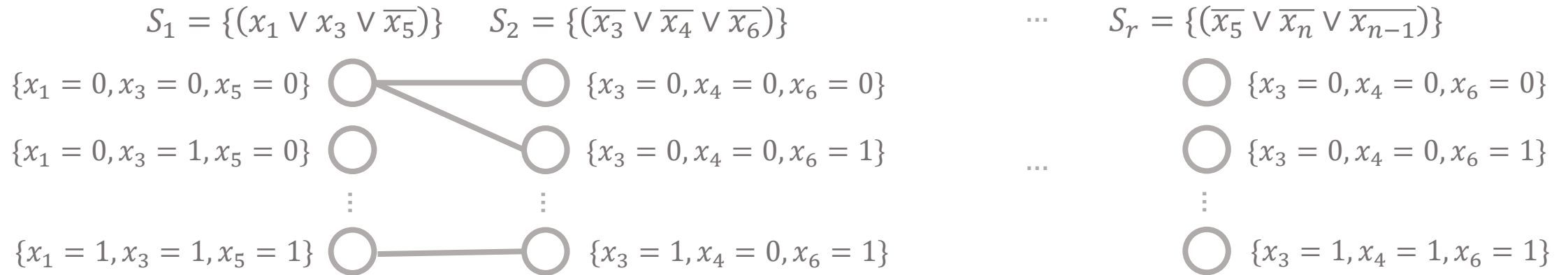




# Proof Sketch: *Inherently Enumerability of $k$ -Clique*

GOAL:  $val(\Phi) < 0.99 \Rightarrow Clique(G) < k$

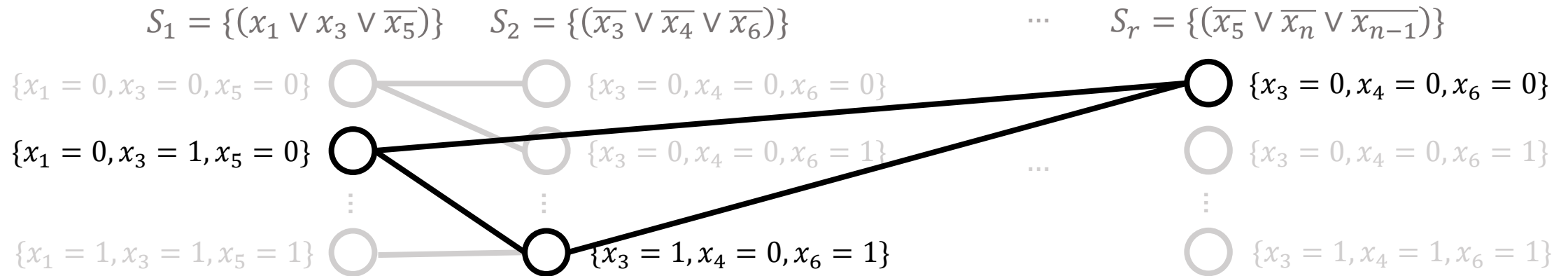
Suppose that  $Clique(G) \geq k$



# Proof Sketch: *Inherently Enumerability of $k$ -Clique*

GOAL:  $val(\Phi) < 0.99 \Rightarrow Clique(G) < k$

Suppose that  $Clique(G) \geq k$



Let these vertices be  
from  $S_{i_1}, S_{i_2}, \dots, S_{i_k}$

An assignment that satisfies all  
clauses in  $S_{i_1} \cup S_{i_2} \cup \dots \cup S_{i_k}$

$val(\Phi) \geq 0.99$

Recall  $S_{i_1}, S_{i_2}, \dots, S_{i_k}$  are random  
subsets of clauses of size  $1000m/k$

With high probability,  
 $|S_{i_1} \cup S_{i_2} \cup \dots \cup S_{i_k}| \geq 0.99m$

QED!

---

# Part II: Dominating Set

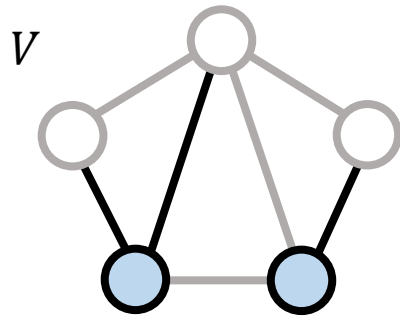
# Parameterized Inapproximability

## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$

Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $k$   
such that  $S \cup N(S) = V$



FPT Algo:  $f(k)n^{O(1)}$ -time for some function  $f$

[\[Downey-Fellows'92\]](#)  $k$ -Dominating Set is W[2]-complete

[\[Chen-Chor-Fellows-Huang-Juedes-Kanj-Xia'05\]](#)

ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Dom Set

[\[Patrascu-Williams'10\]](#)

SETH  $\Rightarrow$  no  $f(k)n^{k-\varepsilon}$ -time algo for  $k$ -Dom Set

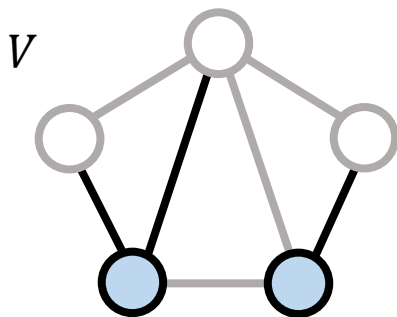
# Parameterized Inapproximability

## $k$ -Dominating Set

Input: A graph  $G = (V, E)$ , integer  $k$

Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $g(k) \cdot k$  such that  $S \cup N(S) = V$



FPT Approx Algo:  $g(k)$ -approx  $f(k)n^{o(1)}$ -time  
for some function  $f, g$

[Downey-Fellows'92]  $k$ -Dominating Set is  $W[2]$ -complete

[Chen-Chor-Fellows-Huang-Juedes-Kanj-Xia'05]

ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Dom Set

[Patrascu-Williams'10]

SETH  $\Rightarrow$  no  $f(k)n^{k-\varepsilon}$ -time algo for  $k$ -Dom Set

---

[Chen-Lin'16]  $W[1] \neq \text{FPT} \Rightarrow$  no constant factor FPT

approx algo for  $k$ -Dom Set

[Karthik-Laekhanukit-M'18]

$W[1] \neq \text{FPT} \Rightarrow$  no FPT  $g(k)$ -approx algo for  $k$ -Dom Set

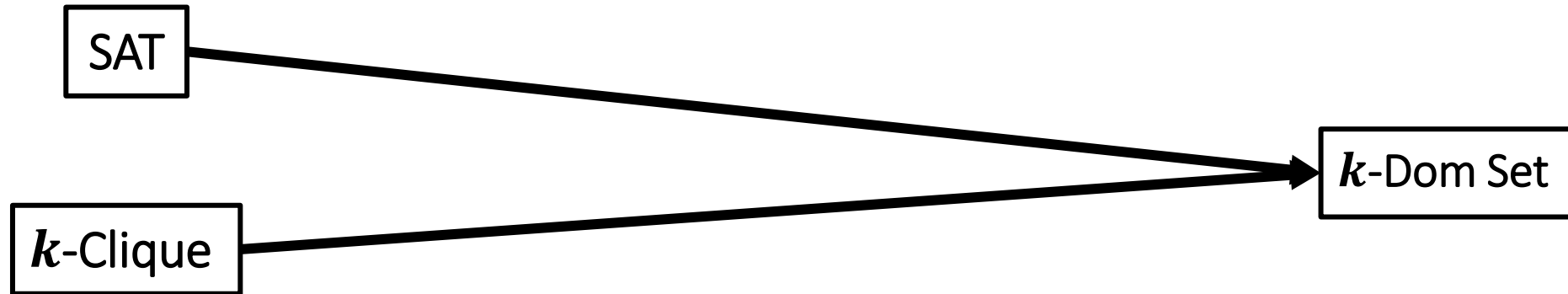
ETH  $\Rightarrow$  no  $g(k)$ -approx  $f(k)n^{o(k)}$ -time algo for  $k$ -Dom Set

SETH  $\Rightarrow$  no  $g(k)$ -approx  $f(k)n^{k-\varepsilon}$ -time algo for  $k$ -Dom Set

[Lin'18] Alternative (beautiful) proof

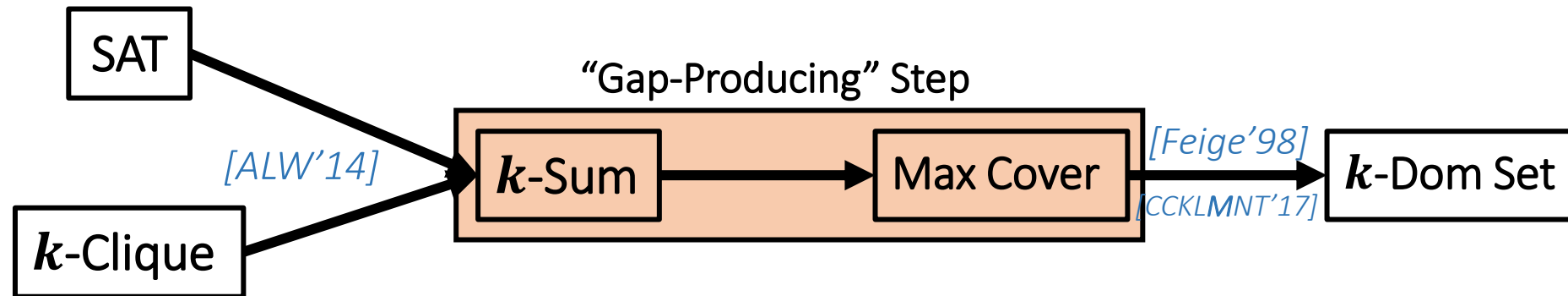
# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## Overview



# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## Overview



Key: Communication Protocol  $\Rightarrow$  hardness of approximation

*“Distributed PCP”* framework of [Abboud-Rubinfeld-Williams’18]

# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## $k$ -Sum

Input:  $k$  sets of  $n$  integers  
 $A_1, \dots, A_k \subseteq [-n^{2k}, n^{2k}]$

Output: Whether there exists  
 $a_1 \in A_1, \dots, a_k \in A_k$  s.t.  
 $a_1 + \dots + a_k = 0$

[\[Abboud-Williams-Lewi'14\]](#)

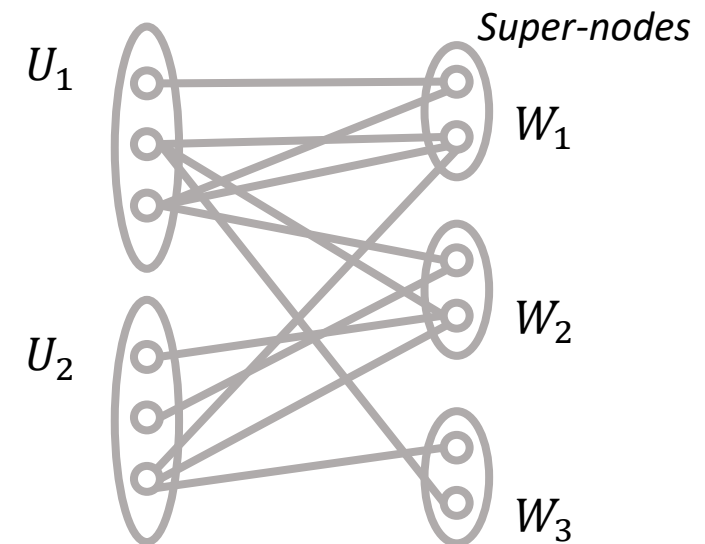
$k$ -Sum is W[1]-complete

ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Sum

## Max Cover

Input: A bipartite graph  $(U_1 \cup \dots \cup U_h, W_1 \cup \dots \cup W_k, E)$

Parameter:  $k$





# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## $k$ -Sum

Input:  $k$  sets of  $n$  integers  
 $A_1, \dots, A_k \subseteq [-n^{2k}, n^{2k}]$

Output: Whether there exists  
 $a_1 \in A_1, \dots, a_k \in A_k$  s.t.  
 $a_1 + \dots + a_k = 0$

[Abboud-Williams-Lewi'14]

$k$ -Sum is W[1]-complete

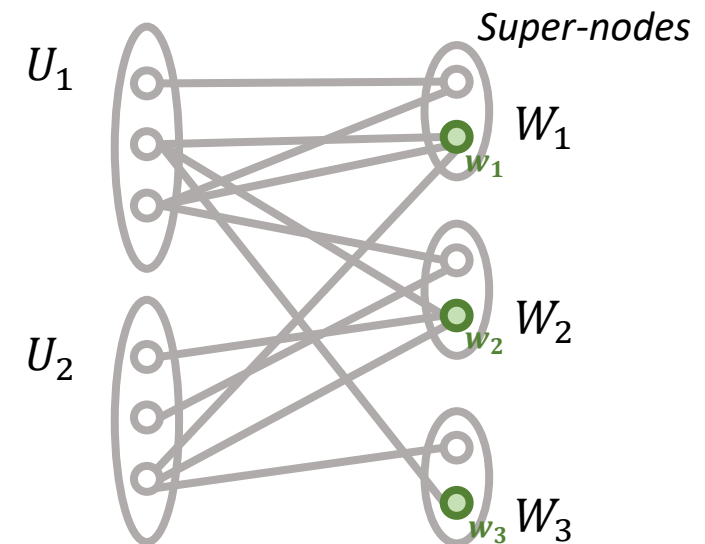
ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Sum

## Max Cover

Input: A bipartite graph  $(U_1 \cup \dots \cup U_h, W_1 \cup \dots \cup W_k, E)$

Parameter:  $k$

Output:  $w_1 \in W_1, \dots, w_k \in W_k$  that “**covers**”  
maximum number of vertices in  $U$



# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## $k$ -Sum

Input:  $k$  sets of  $n$  integers  
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[Abboud-Williams-Lewi'14]

$k$ -Sum is W[1]-complete

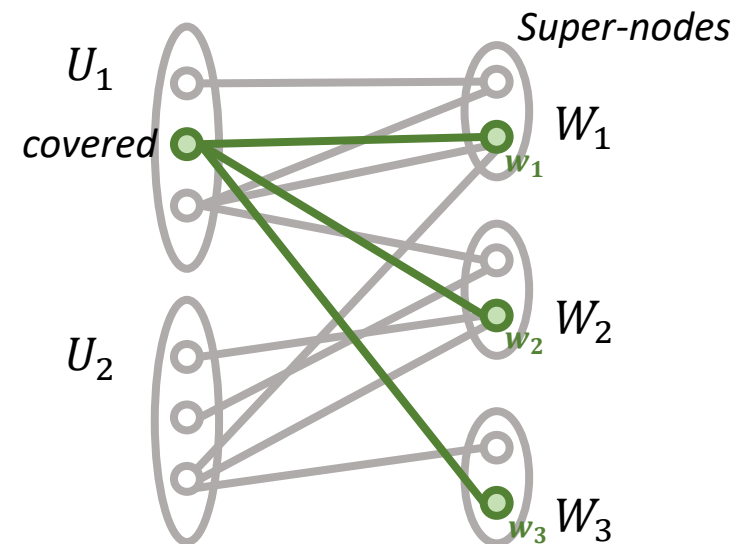
ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Sum

## Max Cover

Input: A bipartite graph  $(U_1 \cup \dots \cup U_h, W_1 \cup \dots \cup W_k, E)$

Parameter:  $k$

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maximum number of vertices in  $U$



## Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## $k$ -Sum

Input:  $k$  sets of  $n$  integers  
 $A_1, \dots, A_k \subseteq [-n^{2k}, n^{2k}]$

**Output:** Whether there exists  
 $a_1 \in A_1, \dots, a_k \in A_k$  s.t.  
 $a_1 + \dots + a_k = 0$

[Abboud-Williams-Lewi'14]

## $k$ -Sum is $W[1]$ -complete

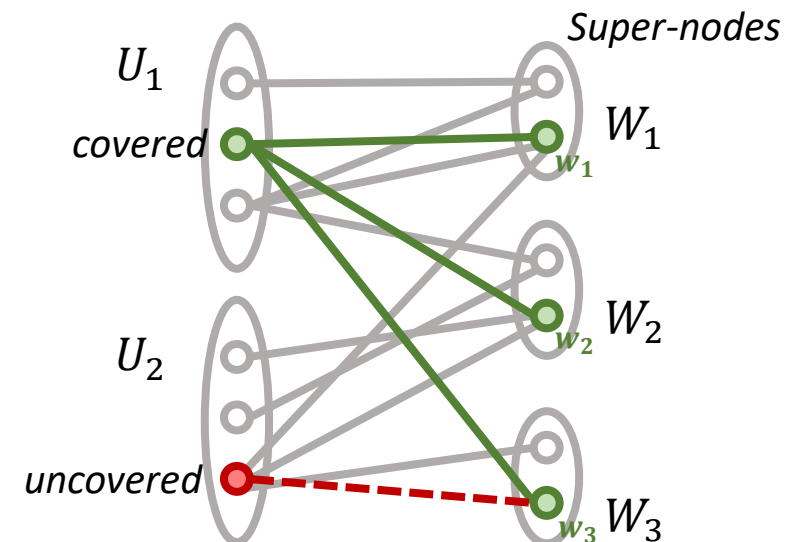
ETH  $\Rightarrow$  no  $f(k)n^{o(k)}$ -time algo for  $k$ -Sum

# Max Cover

**Input:** A bipartite graph  $(U_1 \cup \dots \cup U_h, W_1 \cup \dots \cup W_k, E)$

Parameter:  $k$ 

Output:  $w_1 \in W_1, \dots, w_k \in W_k$  that “**covers**”  
maximum number of vertices in  $U$



# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

## **$k$ -Sum Instance $(A_1, \dots, A_k)$**

Size:  $n$

Parameter:  $k$

YES:  $\exists a_1 \in A_1, \dots, a_k \in A_k, a_1 + \dots + a_k = 0$

NO:  $\forall a_1 \in A_1, \dots, a_k \in A_k, a_1 + \dots + a_k \neq 0$

ETH Lower Bound:  $n^{\Omega(k)}$

W[1]-hard

## **Max Cover Instance $G$**

Size:  $N = n^{1+o(1)}$

Parameter:  $k$

YES:  $MaxCover(G) = h$

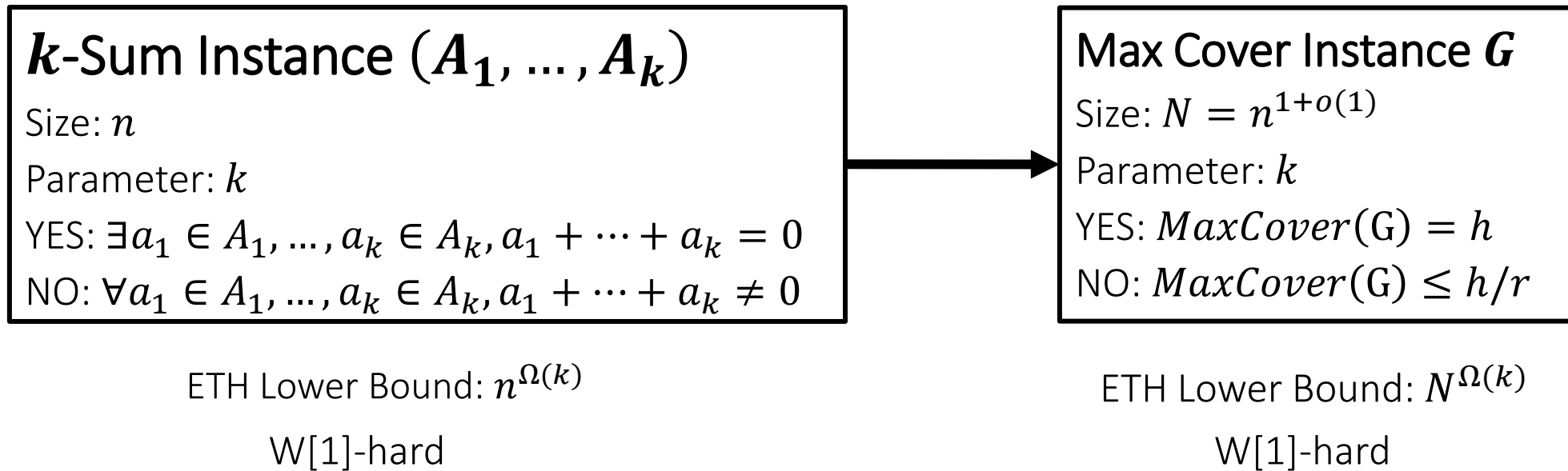
NO:  $MaxCover(G) \leq h/r$

ETH Lower Bound:  $N^{\Omega(k)}$

W[1]-hard



# Proof Sketch: *Total Inapproximability of $k$ -Dom Set*

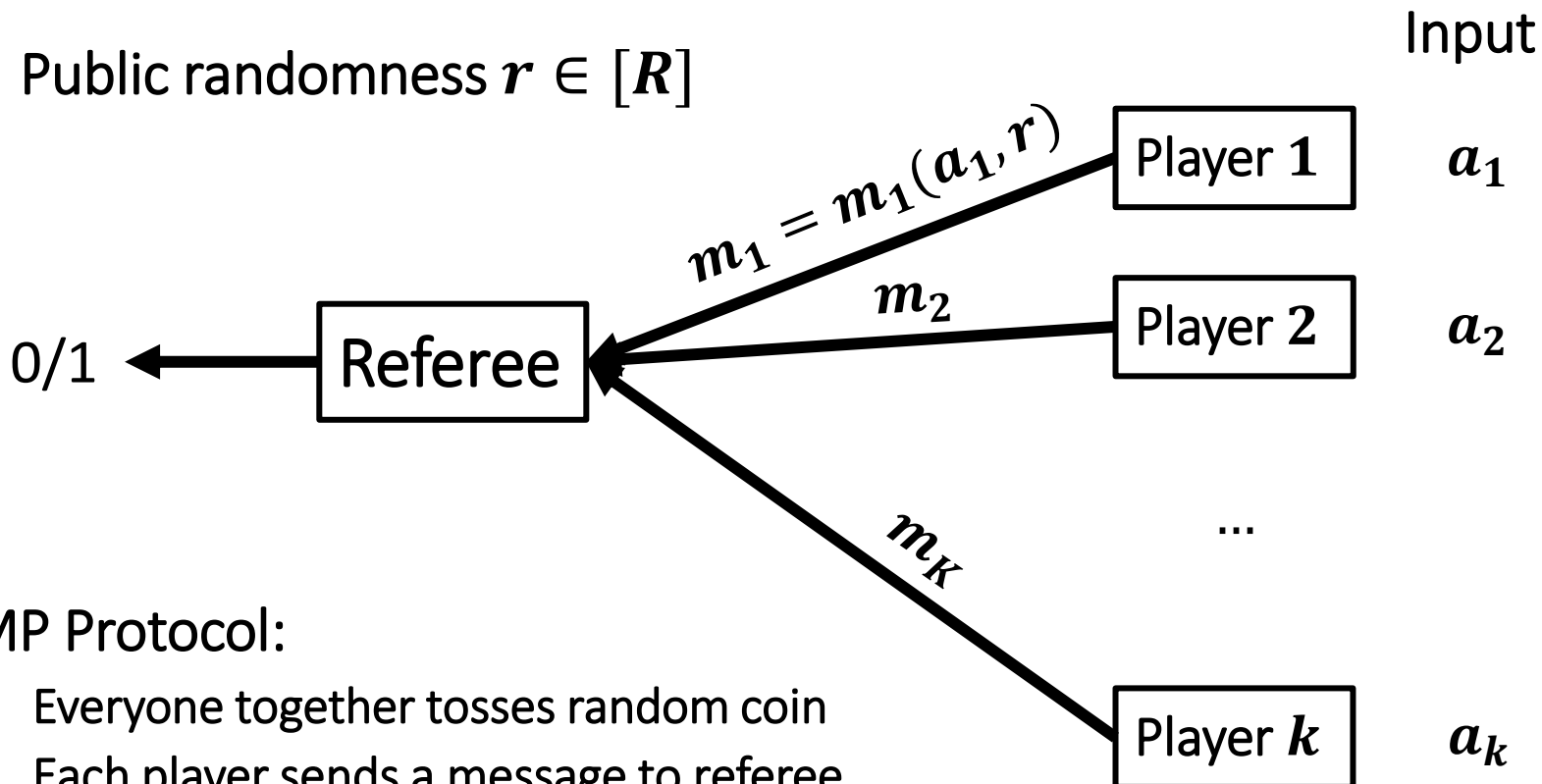


Key: Communication Protocol  $\Rightarrow$  hardness of approximation

*“Distributed PCP”* framework of [\[Abboud-Rubinstein-Williams’18\]](#)

# Communication Model: Simultaneous Message Passing (SMP)

Public randomness  $r \in [R]$



SMP Protocol:

1. Everyone together tosses random coin
2. Each player sends a message to referee
3. Referee output 0 or 1

Goal: Compute

$$f(a_1, \dots, a_k) \in \{0, 1\}$$

Guarantee

**Completeness:**

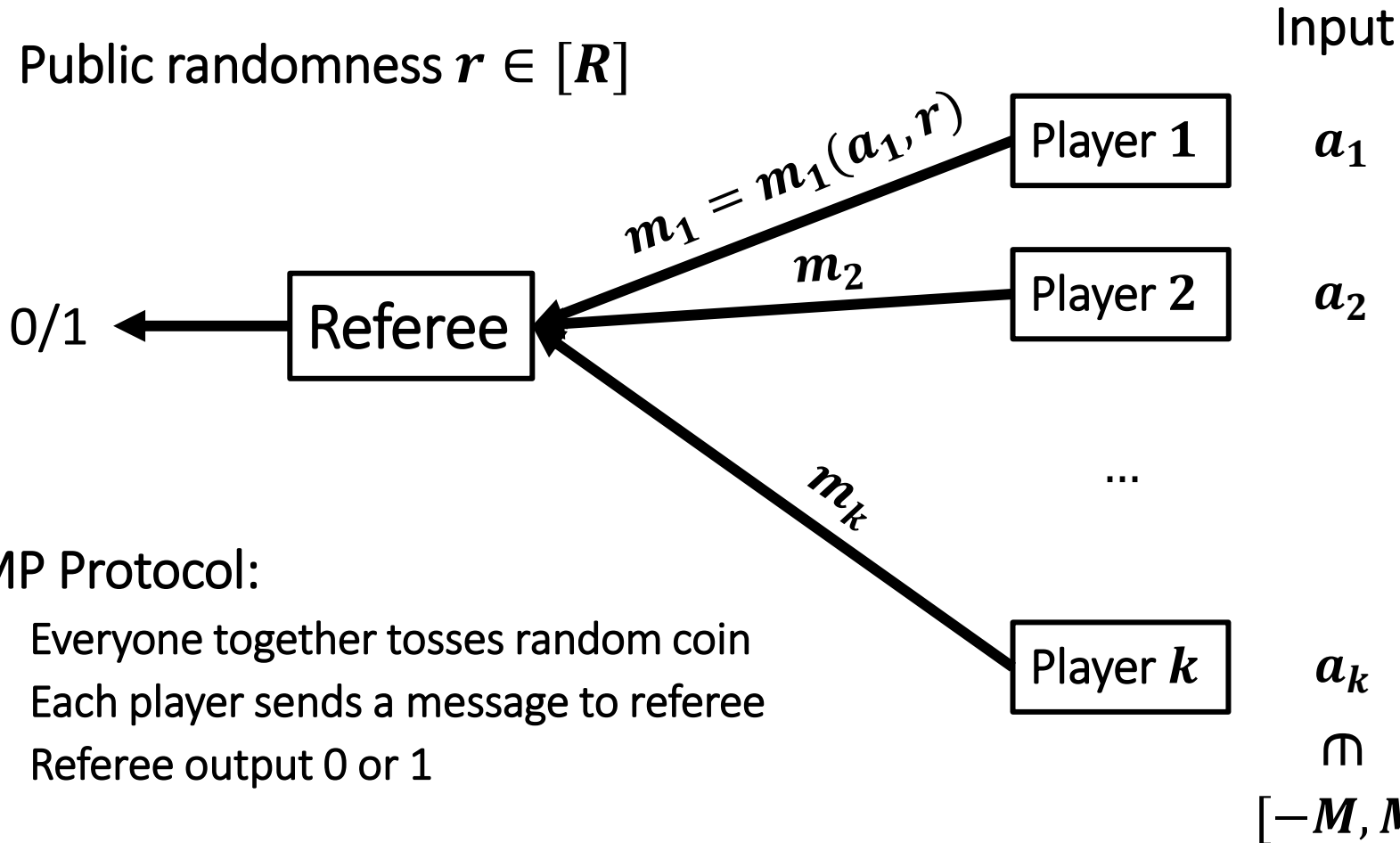
If  $f(a_1, \dots, a_k) = 1$ ,  
then always output 1.

**Soundness:**

If  $f(a_1, \dots, a_k) = 0$ ,  
output 0 w.p.  $1/2$ .

# Zero-Sum Communication Problem

Public randomness  $r \in [R]$



Goal: Compute

$$\mathbf{1}[a_1 + \dots + a_k = 0]$$

Guarantee

**Completeness:**

If  $f(a_1, \dots, a_k) = 1$ ,  
then always output 1.

**Soundness:**

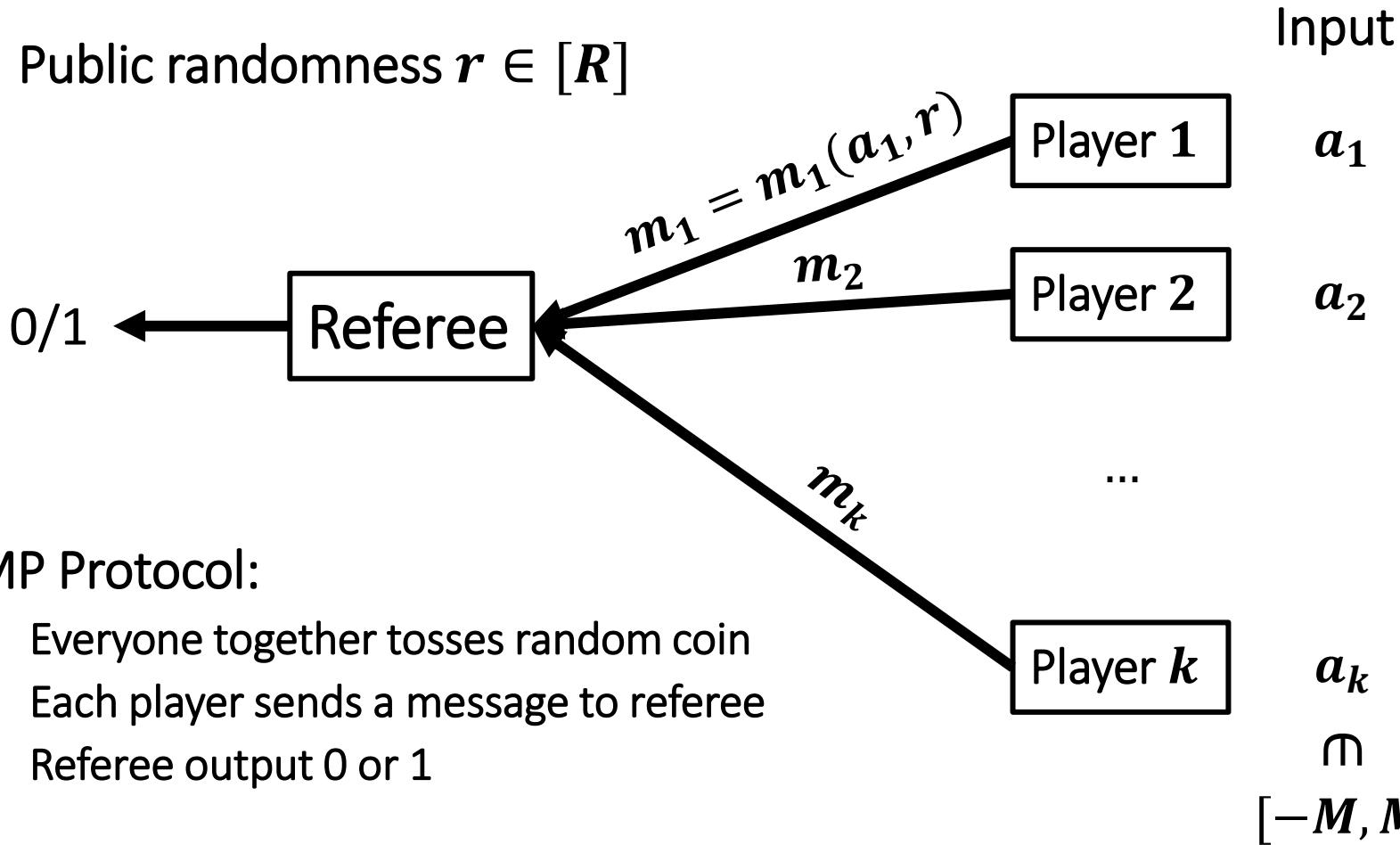
If  $f(a_1, \dots, a_k) = 0$ ,  
output 0 w.p.  $1/2$ .

SMP Protocol:

1. Everyone together tosses random coin
2. Each player sends a message to referee
3. Referee output 0 or 1

# Zero-Sum Communication Problem

Public randomness  $r \in [R]$



Goal: Compute

$$1[a_1 + \dots + a_k = 0]$$

Guarantee

**Completeness:**

If  $a_1 + \dots + a_k = 0$ ,  
then always output 1.

**Soundness:**

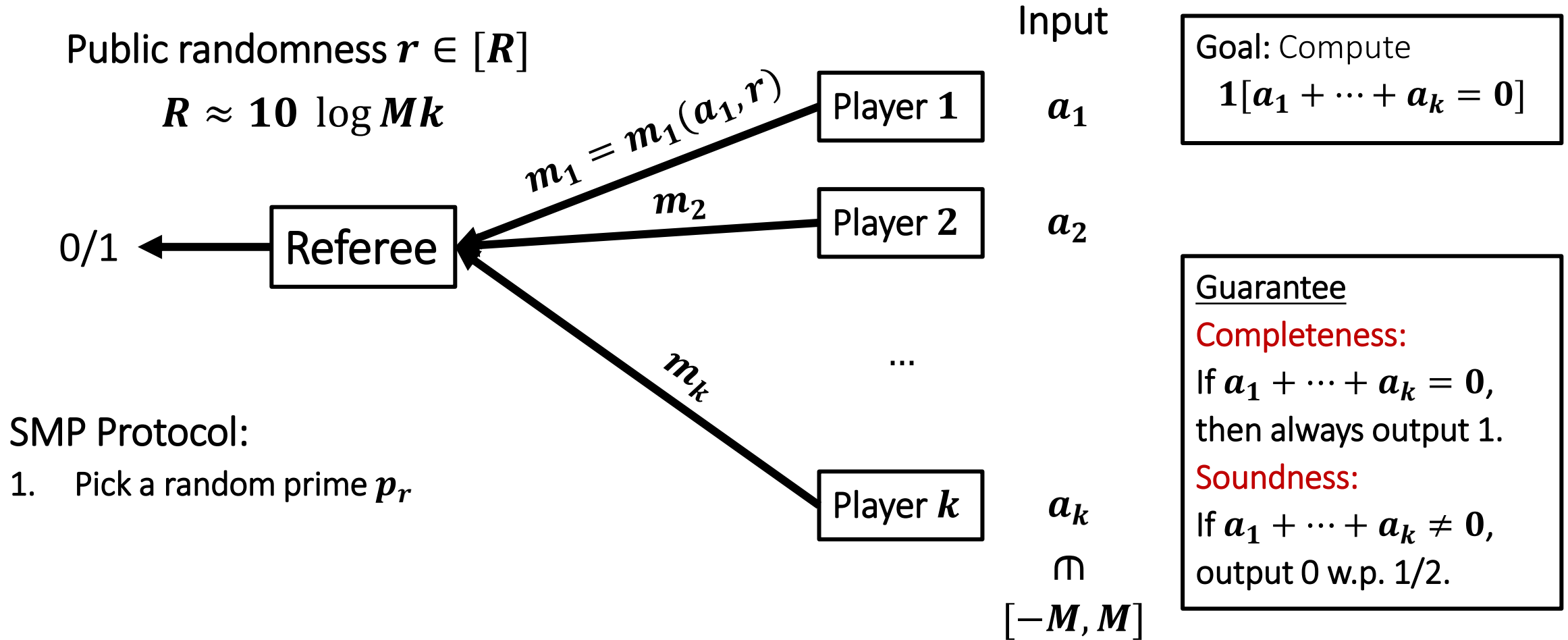
If  $a_1 + \dots + a_k \neq 0$ ,  
output 0 w.p.  $1/2$ .

SMP Protocol:

1. Everyone together tosses random coin
2. Each player sends a message to referee
3. Referee output 0 or 1



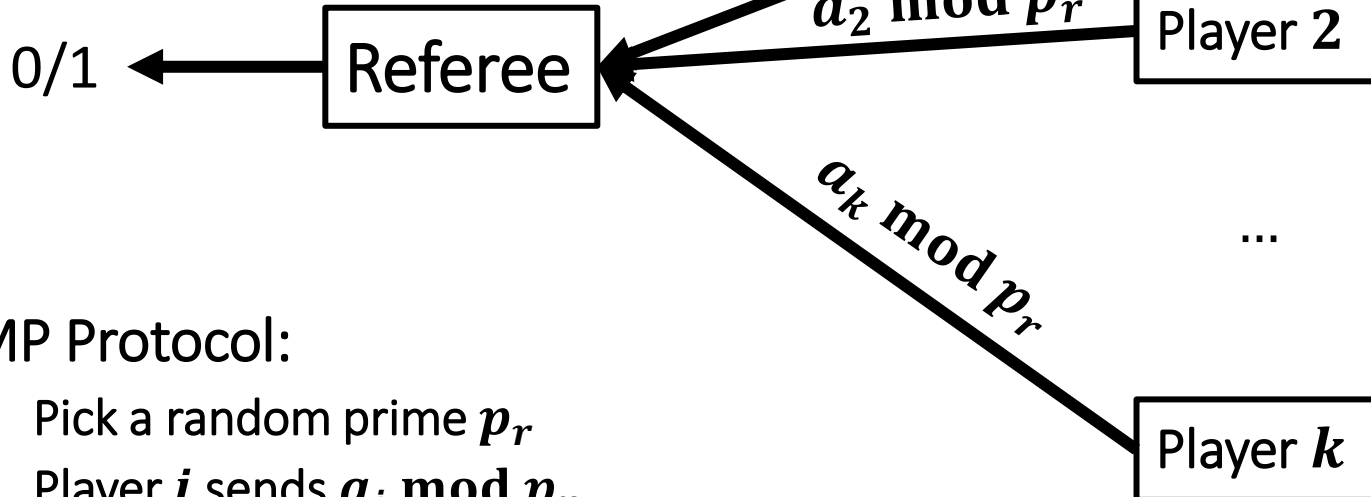
# Zero-Sum Communication Protocol



# Zero-Sum Communication Protocol

Public randomness  $r \in [R]$

$$R \approx 10 \log Mk$$



SMP Protocol:

1. Pick a random prime  $p_r$
2. Player  $i$  sends  $a_i \bmod p_r$
3. Referee output 1 iff the sum is  $0 \bmod p_r$

Input

$a_1$

$a_2$

$a_k$

$\cap$   
 $[-M, M]$

Goal: Compute

$$1[a_1 + \dots + a_k = 0]$$

Guarantee

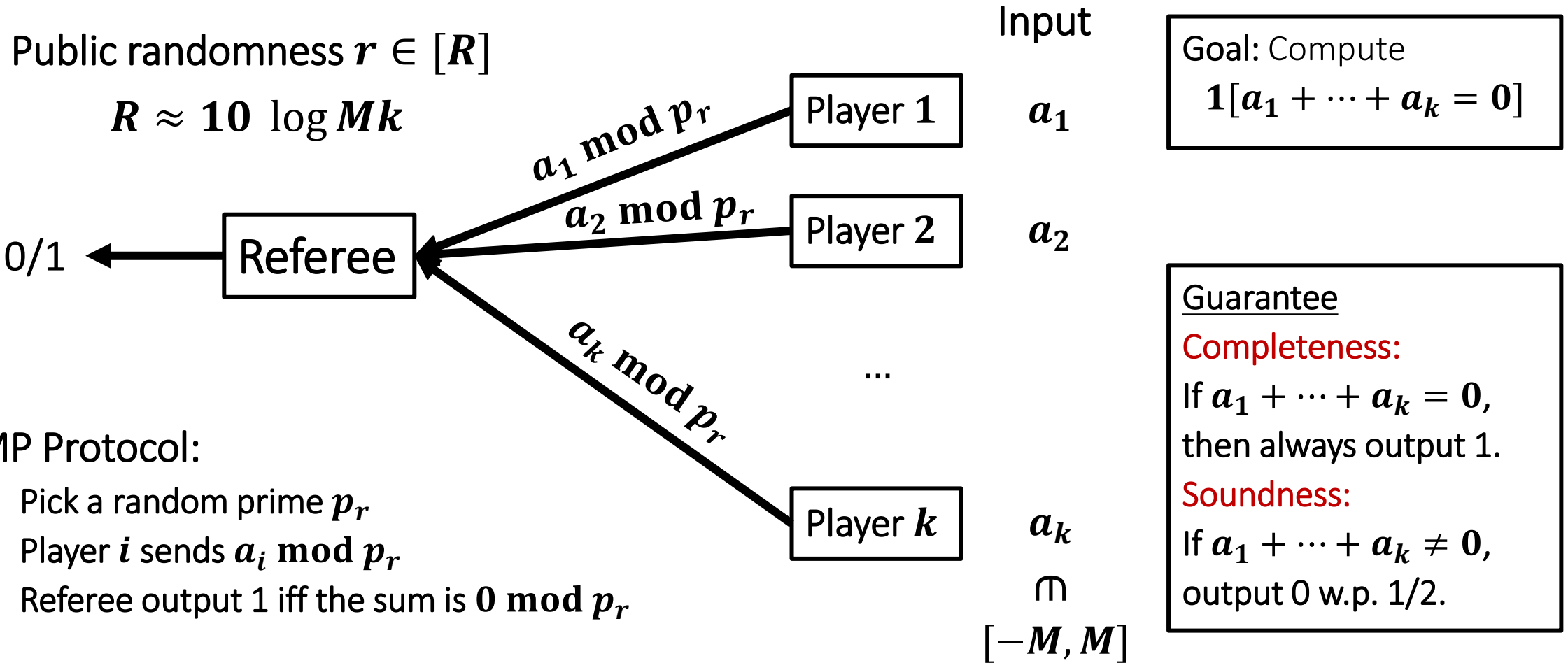
**Completeness:**

If  $a_1 + \dots + a_k = 0$ ,  
then always output 1.

**Soundness:**

If  $a_1 + \dots + a_k \neq 0$ ,  
output 0 w.p.  $1/2$ .

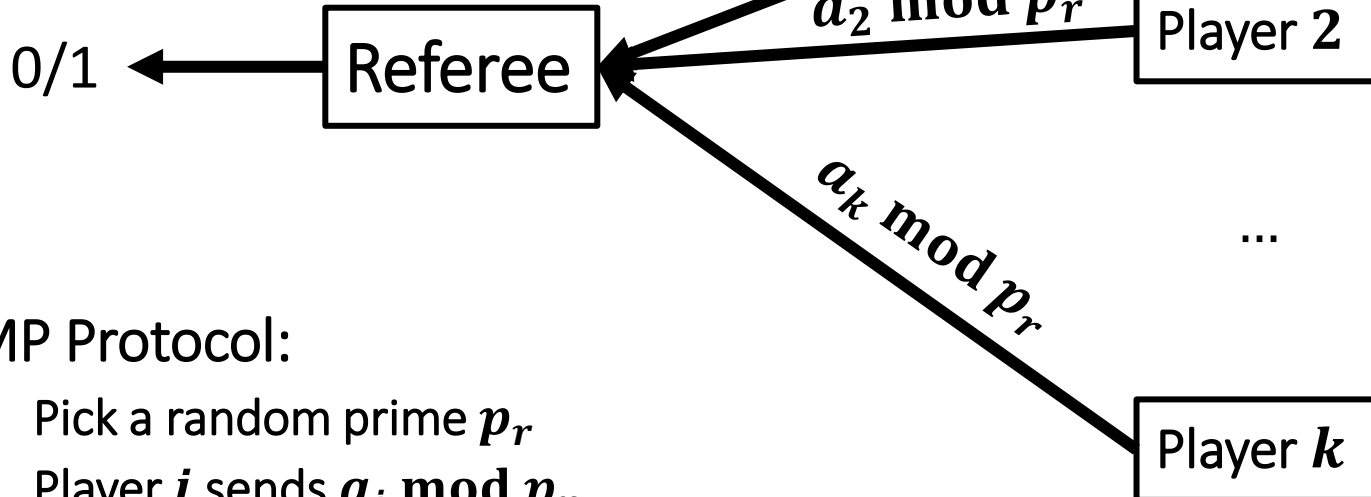
# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover



# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

Public randomness  $r \in [R]$

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Input

$a_1$

$a_2$

$a_k$

$\cap$   
 $[-M, M]$

## $k$ -Sum Problem

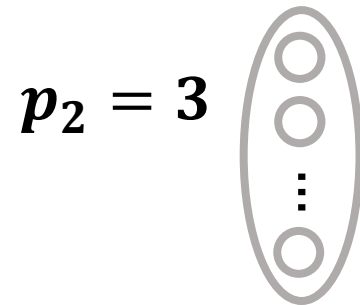
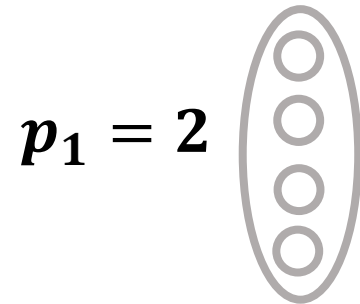
Given  $A_1, \dots, A_k \in [-M, M]$ ,  
determine whether there exist  
 $a_1 \in A_1, \dots, a_k \in A_k$  such that  
 $a_1 + \dots + a_k = 0$

SMP Protocol:

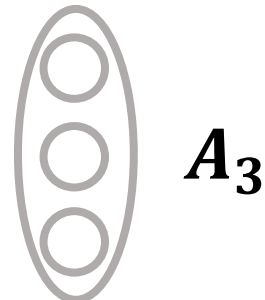
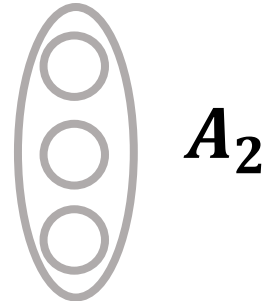
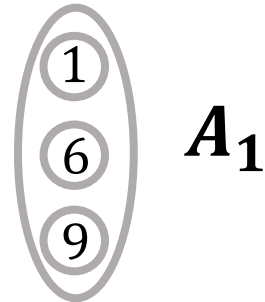
1. Pick a random prime  $p_r$
2. Player  $i$  sends  $a_i \bmod p_r$
3. Referee output 1 iff the sum is  $0 \bmod p_r$

# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

Nodes  $\equiv$  Accepting Configurations



$\vdots$



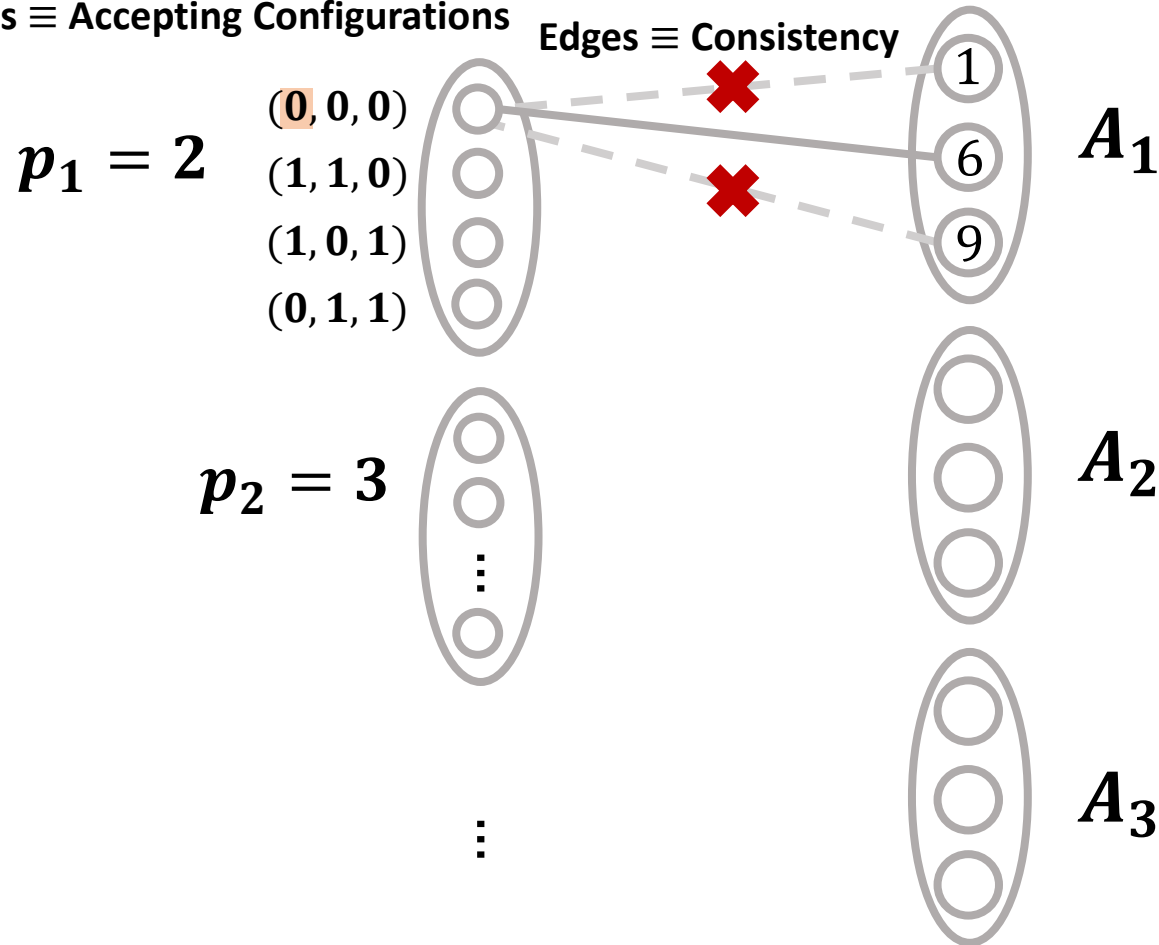
## $k$ -Sum Problem

Given  $A_1, \dots, A_k \in [-M, M]$ ,  
determine whether there exist  
 $a_1 \in A_1, \dots, a_k \in A_k$  such that  
$$a_1 + \dots + a_k = 0$$

# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

Nodes  $\equiv$  Accepting Configurations

Edges  $\equiv$  Consistency



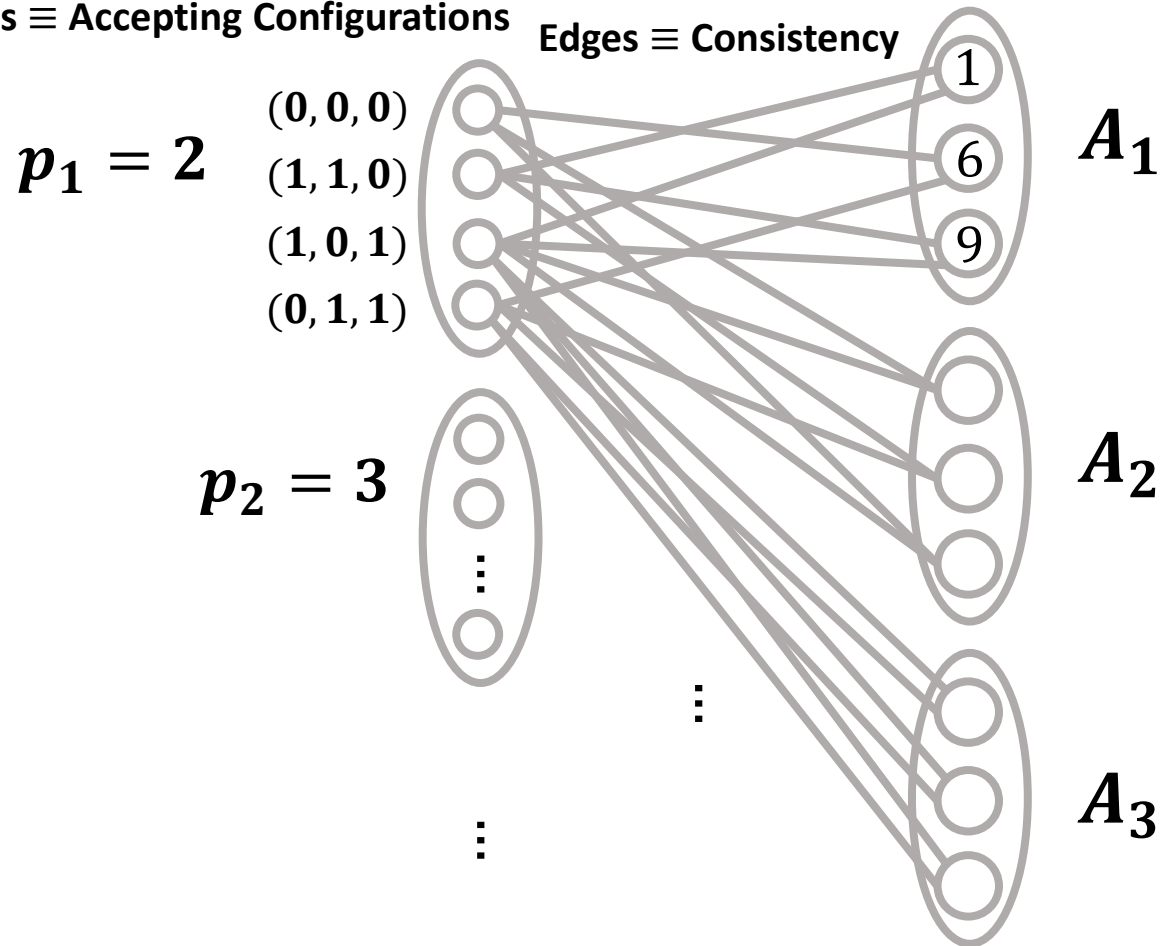
## $k$ -Sum Problem

Given  $A_1, \dots, A_k \in [-M, M]$ ,  
determine whether there exist  
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# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

Nodes  $\equiv$  Accepting Configurations

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## $k$ -Sum Problem

Given  $A_1, \dots, A_k \in [-M, M]$ ,  
determine whether there exist  
 $a_1 \in A_1, \dots, a_k \in A_k$  such that  
$$a_1 + \dots + a_k = 0$$

# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

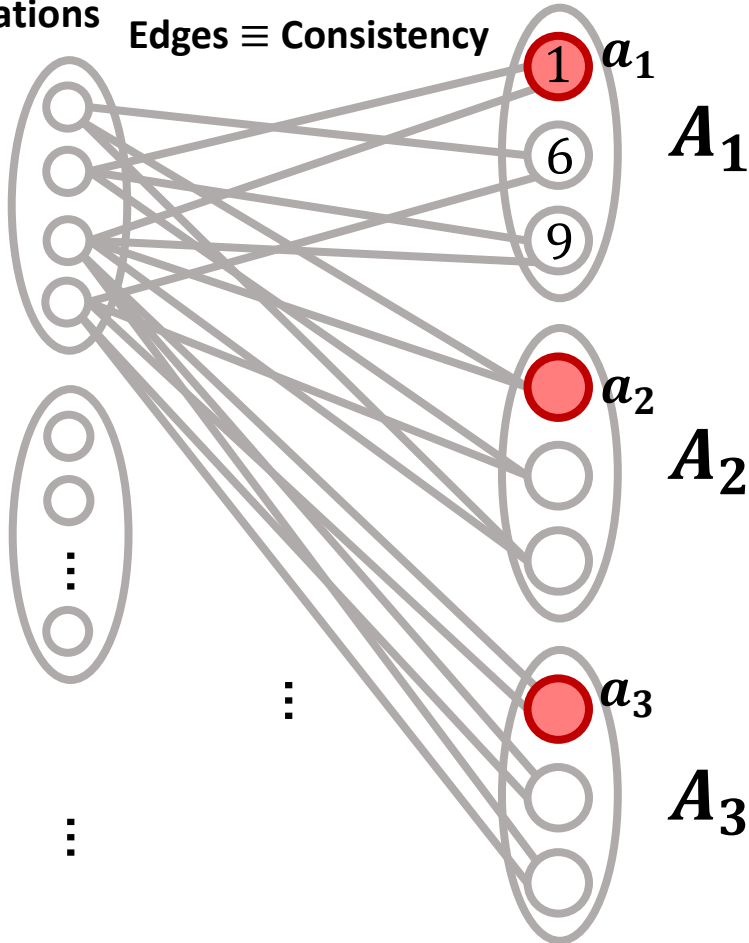
Nodes  $\equiv$  Accepting Configurations

Edges  $\equiv$  Consistency

$p_1 = 2$

$(0, 0, 0)$   
 $(1, 1, 0)$   
 $(1, 0, 1)$   
 $(0, 1, 1)$

$p_2 = 3$



## Key Observation

A Supernode is covered iff  
Referee accepts on  $a_1, \dots, a_k$

## $k$ -Sum Problem

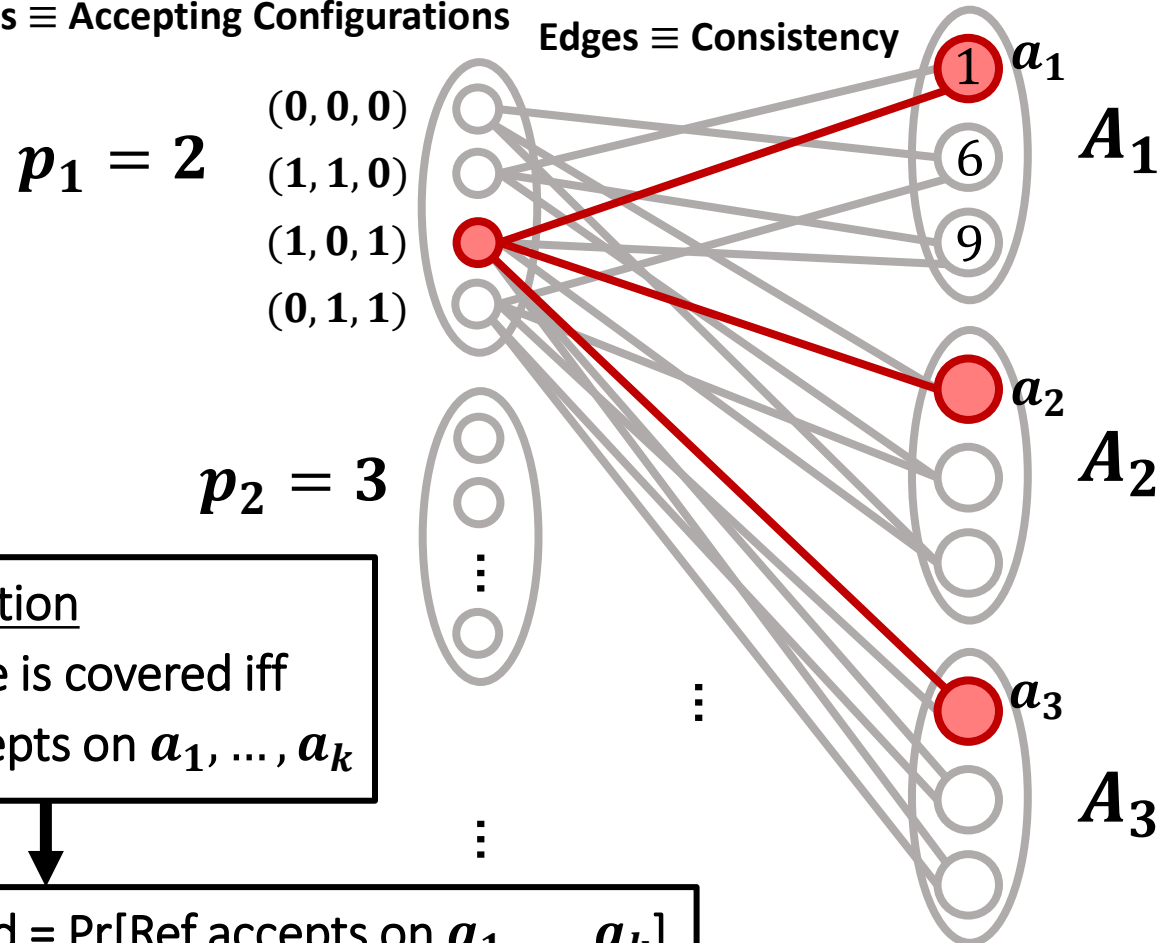
Given  $A_1, \dots, A_k \in [-M, M]$ ,  
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 $a_1 \in A_1, \dots, a_k \in A_k$  such that  
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# Communication Protocol $\equiv k$ -Sum $\Rightarrow$ Max Cover

Nodes  $\equiv$  Accepting Configurations

Edges  $\equiv$  Consistency



## Key Observation

A Supernode is covered iff  
Referee accepts on  $a_1, \dots, a_k$

Fraction covered =  $\Pr[\text{Ref accepts on } a_1, \dots, a_k]$

## $k$ -Sum Problem

Given  $A_1, \dots, A_k \in [-M, M]$ ,  
determine whether there exist  
 $a_1 \in A_1, \dots, a_k \in A_k$  such that  
 $a_1 + \dots + a_k = 0$

YES  $\Rightarrow \text{MaxCover}(G) = h$   
NO  $\Rightarrow \text{MaxCover}(G) \leq h/2$

Remark: Size of  $G$  depends on  
parameters of the protocol

# Recap

## **$k$ -Sum Instance $(A_1, \dots, A_k)$**

Size:  $n = |A_1| + \dots + |A_k|$

Parameter:  $k$

YES:  $\exists a_1 \in A_1, \dots, a_k \in A_k, a_1 + \dots + a_k = 0$

NO:  $\forall a_1 \in A_1, \dots, a_k \in A_k, a_1 + \dots + a_k \neq 0$

SMP Communication  
Protocol for Zero-Sum

## **Max Cover Instance $G$**

Size:  $N = n^{1+o(1)}$

Parameter:  $k$

YES:  $\text{MaxCover}(G) = h$

NO:  $\text{MaxCover}(G) \leq h/2$

# A General Framework

## Product Space Problem $(A_1, \dots, A_k)$

Size:  $n = |A_1| + \dots + |A_k|$

Parameter:  $k$

YES:  $\exists a_1 \in A_1, \dots, a_k \in A_k, f(a_1, \dots, a_k) = 1$

NO:  $\forall a_1 \in A_1, \dots, a_k \in A_k, f(a_1, \dots, a_k) = 0$

SMP Communication  
Protocol for  $f$

## Max Cover Instance $G$

Size:  $N = n^{1+o(1)}$

Parameter:  $k$

YES:  $\text{MaxCover}(G) = h$

NO:  $\text{MaxCover}(G) \leq h/2$

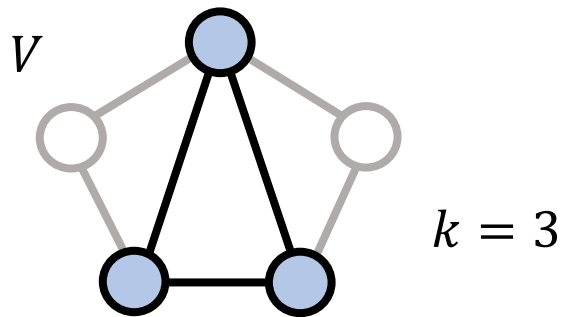
# Clique as Product Space Problem

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $k$   
that induces a clique



## Product Space Problem

Input:  $A_1 = \dots = A_{\binom{k}{2}} = \vec{E}$

Parameter:  $\binom{k}{2}$

Predicate:  
 $f$  “checks that the edges form a clique”

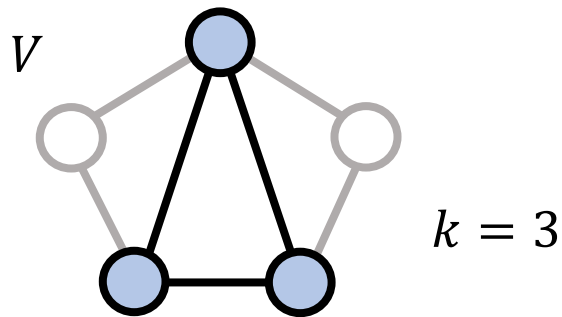
# Clique as Product Space Problem

## $k$ -Clique

Input: A graph  $G = (V, E)$ , integer  $k$

Parameter:  $k$

Output: A subset  $S \subseteq V$  of size  $k$   
that induces a clique



## Product Space Problem

Input:  $A_{(1,2)} = \dots = A_{(k-1,k)} = \vec{E}$

Parameter:  $\binom{k}{2}$

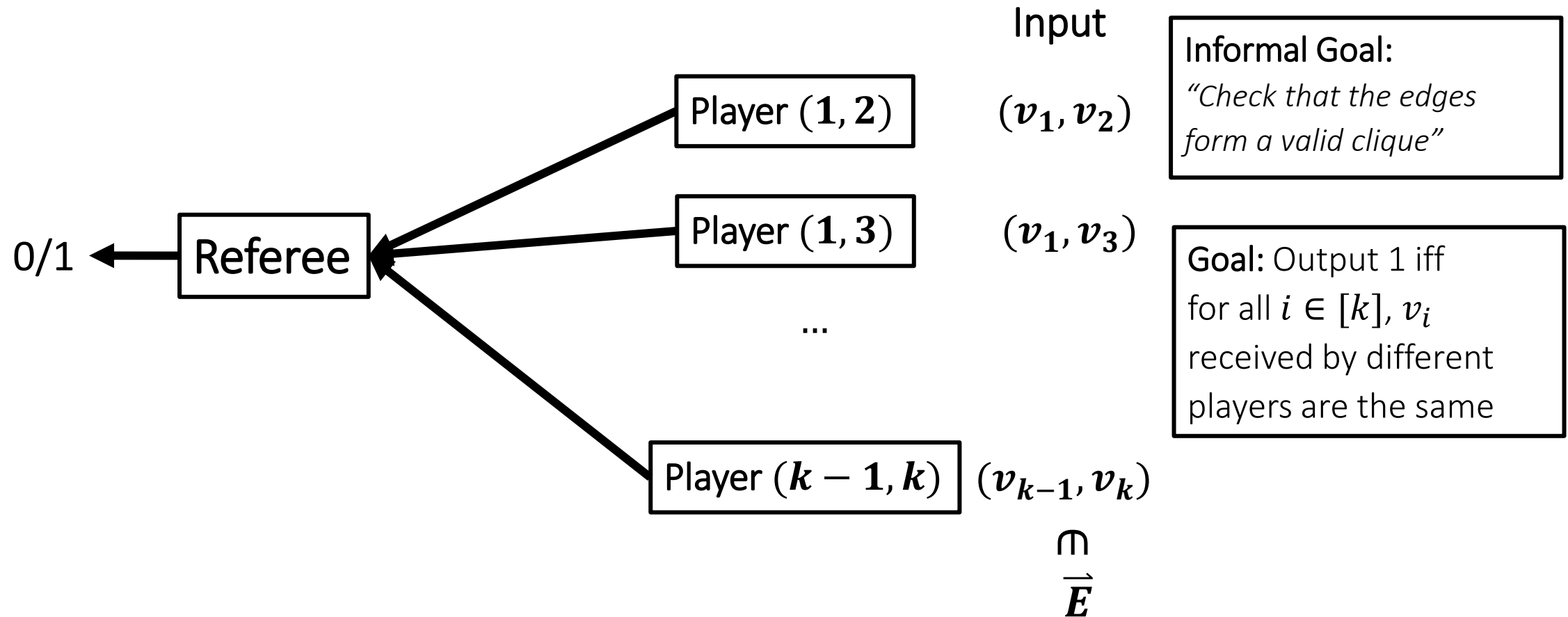
Predicate:

$f$  “checks that the edges form a clique”

More formally:

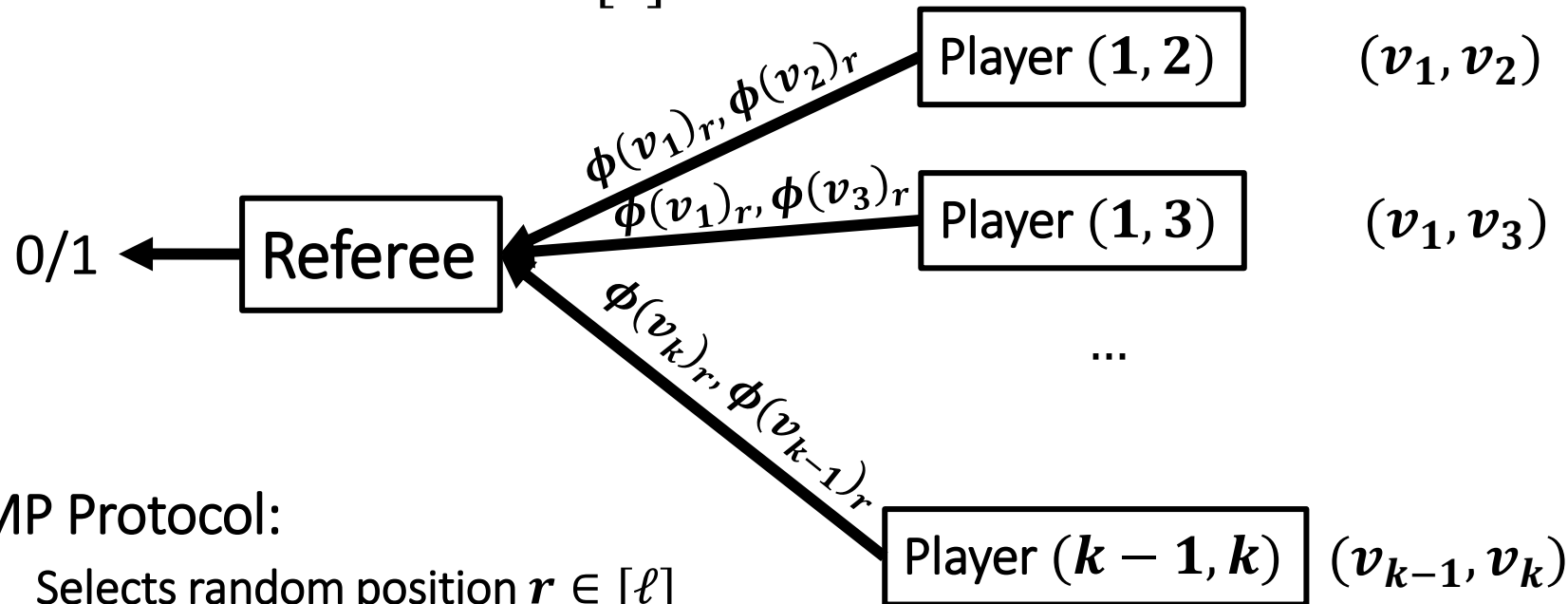
$f((v_1, v_2), (v_1, v_3), \dots, (v_{k-1}, v_k)) = 1$   
iff, for all  $i \in [k]$ ,  $v_i$ 's are all equal

# Consistent Clique Communication Problem



# Consistent Clique Communication Problem

Public randomness  $r \in [\ell]$



Informal Goal:

*"Check that the edges form a valid clique"*

Goal: Output 1 iff

for all  $i \in [k]$ ,  $v_i$  received by different players are the same

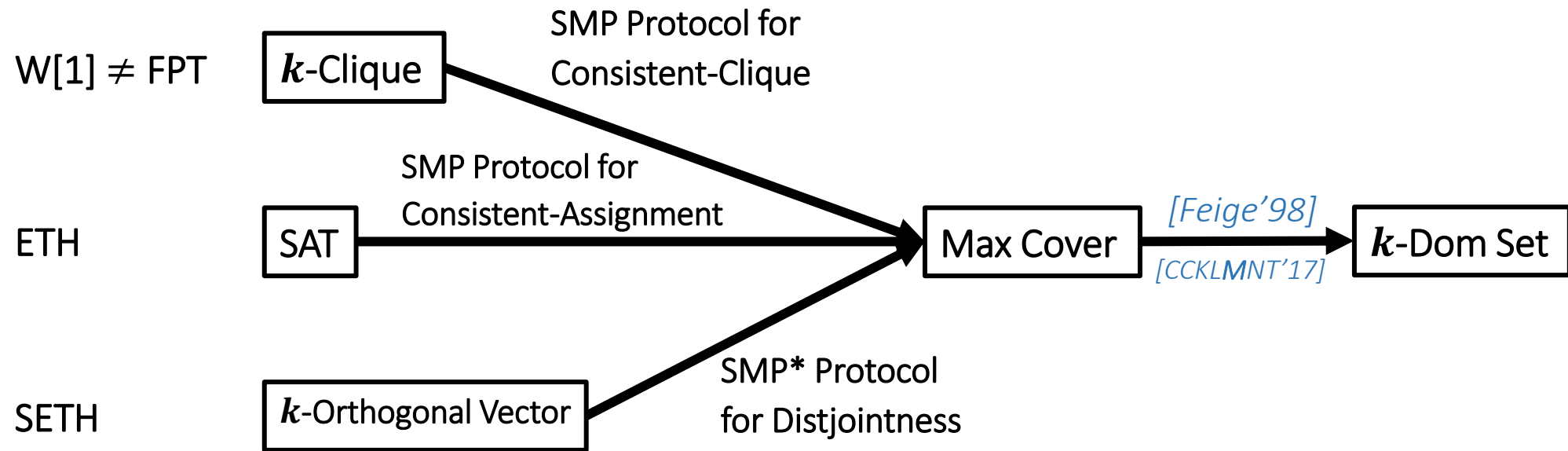
Error Correcting Codes

$\phi: [n] \rightarrow \{0,1\}^\ell$  such that  $\Delta(\phi(x), \phi(y)) > 0.1 \cdot \ell$  for all  $x \neq y$ .

SMP Protocol:

1. Selects random position  $r \in [\ell]$
2. Player ( $i, j$ ) sends  $(\phi(v_i)_r, \phi(v_j)_r)$  to referee
3. Referee checks that  $\phi(v_i)_r$  are all equal

# A General Framework



[Lin'18] Alternative approach that doesn't use communication protocols...



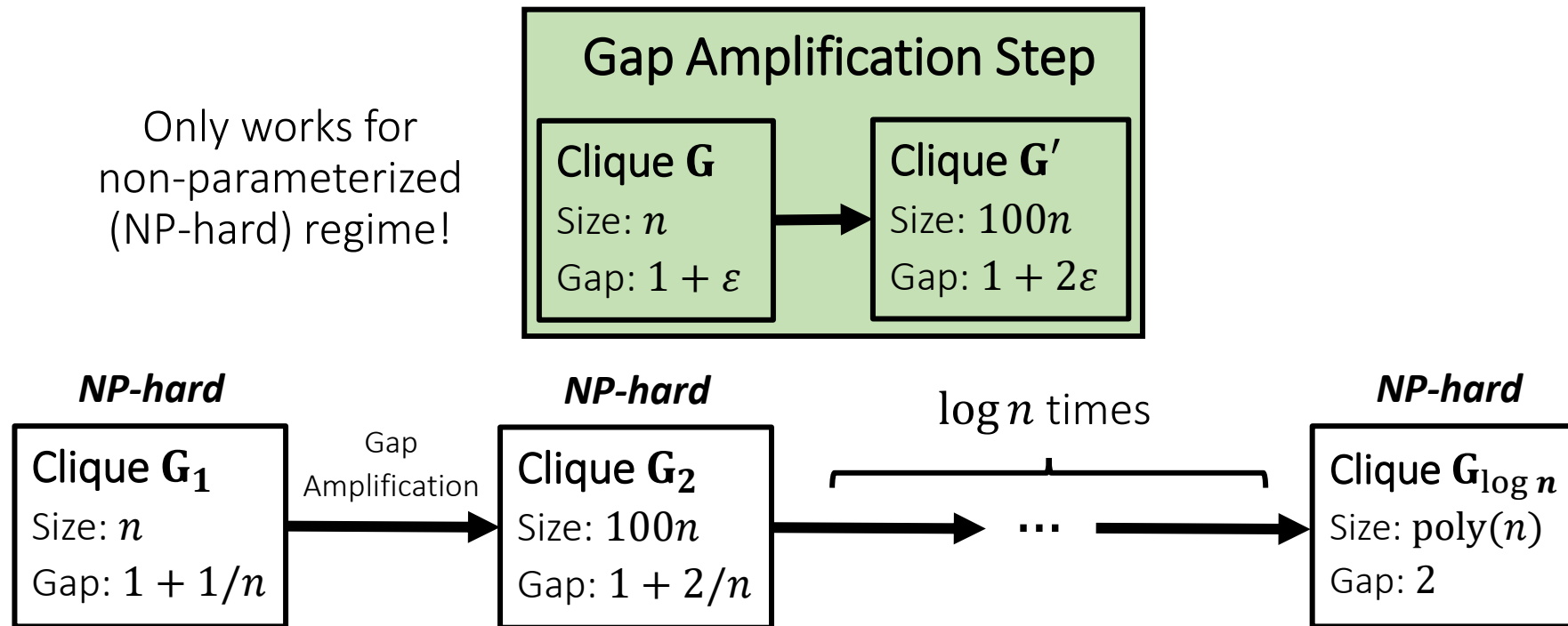
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# Part III:

## Repeated Gap Amplification

# Dinur's Proof of PCP Theorem

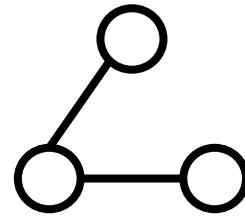
PCP Theorem Clique is NP-hard to approximate to within 2 factor



# Gap Amplification for $k$ -Clique?

Parameterized PCP Theorem? Clique is  $W[1]$ -hard to approximate to within 2 factor

$$G = (V, E)$$

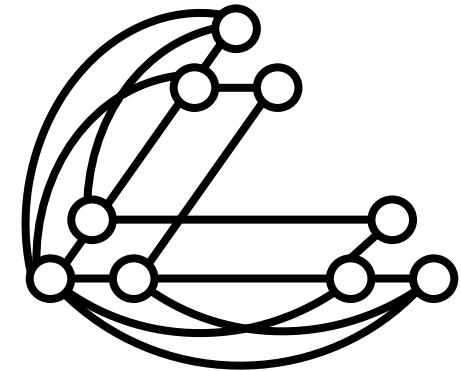


Tensor Product

$$\text{Clique}(G^{\otimes 2}) = \text{Clique}(G)^2$$

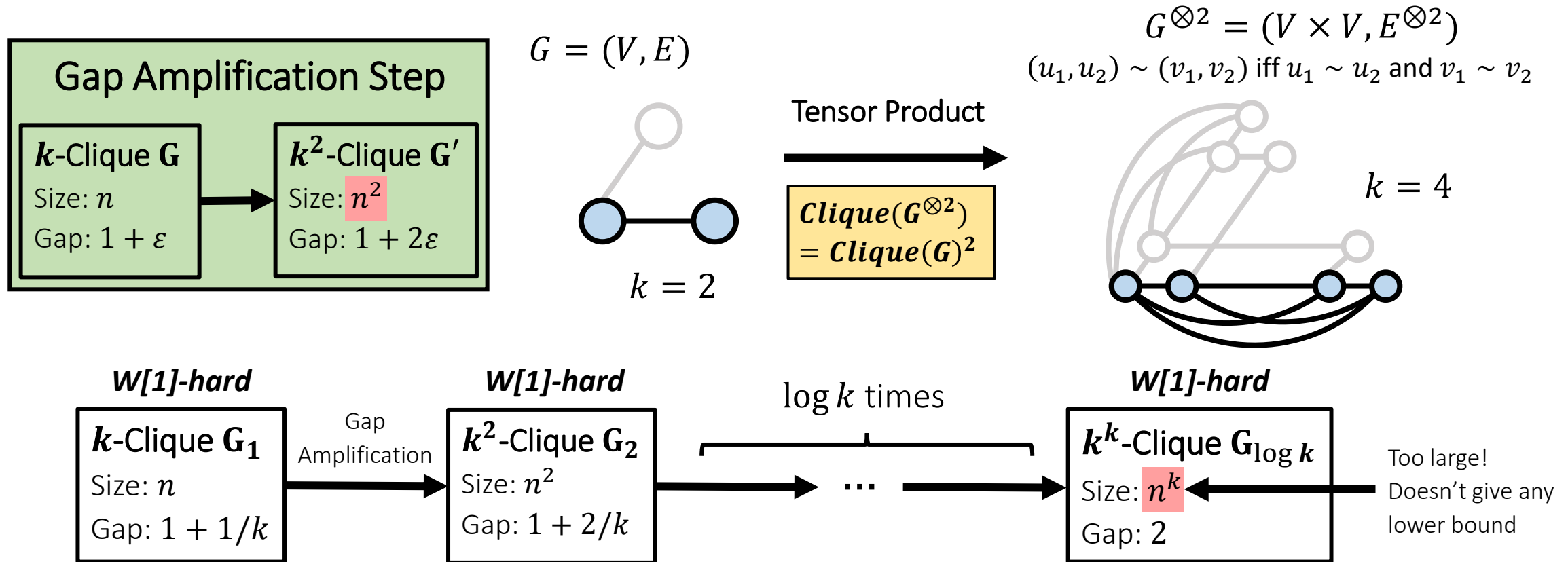
$$G^{\otimes 2} = (V \times V, E^{\otimes 2})$$

$(u_1, u_2) \sim (v_1, v_2)$  iff  $u_1 \sim u_2$  and  $v_1 \sim v_2$



# Gap Amplification for $k$ -Clique?

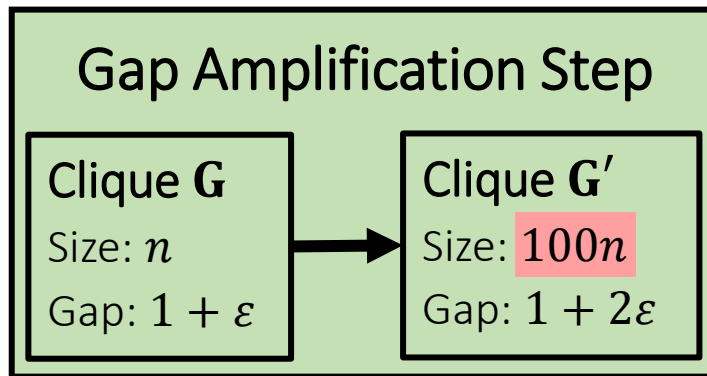
Parameterized PCP Theorem? Clique is  $W[1]$ -hard to approximate to within 2 factor



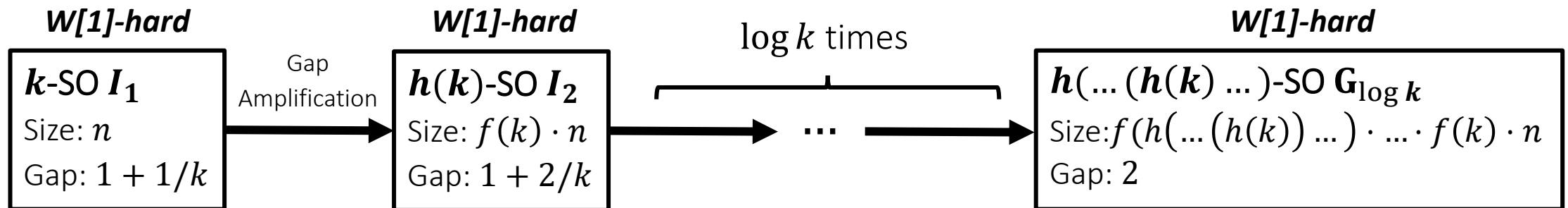
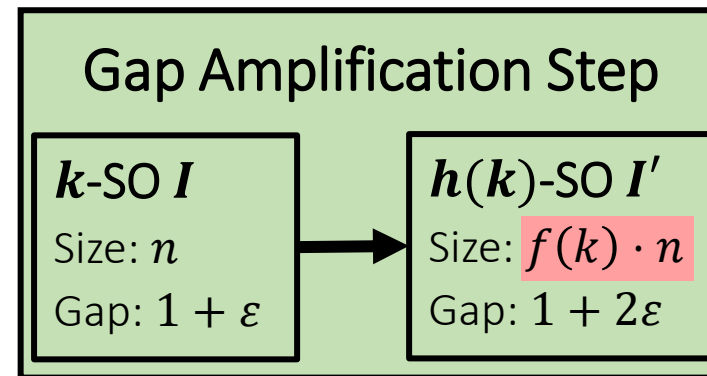
# Gap Amplification: a success story

Theorem [Włodarczyk'19]  $k$ -Steiner Orientation ( $k$ -SO) is  $W[1]$ -hard to approximate to within  $(\log k)^{o(1)}$  factor

[Dinur'07]

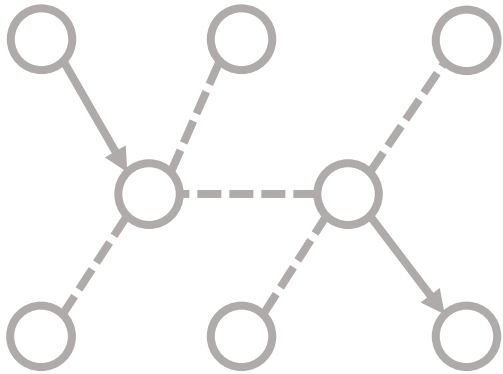


[Włodarczyk'19]



# $k$ -Steiner Orientation ( $k$ -SO)

Input: A mixed graph  $G = (V, E)$ ,  
 $k$  terminal pairs  $(s_1, t_1), \dots, (s_k, t_k)$

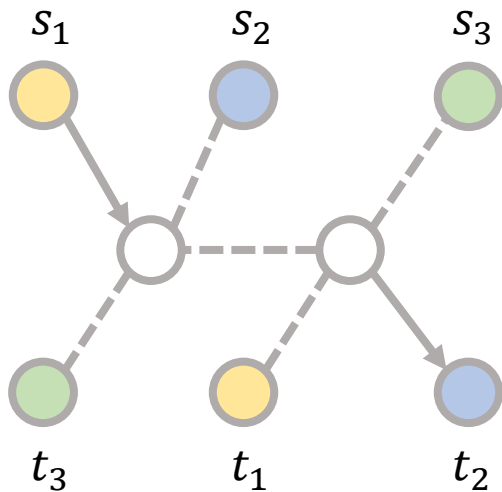


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Input: A mixed graph  $G = (V, E)$ ,  
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Parameter:  $k$

Output: Orientation of undirected edges  
that maximizes pairs  $s_i \rightarrow t_i$

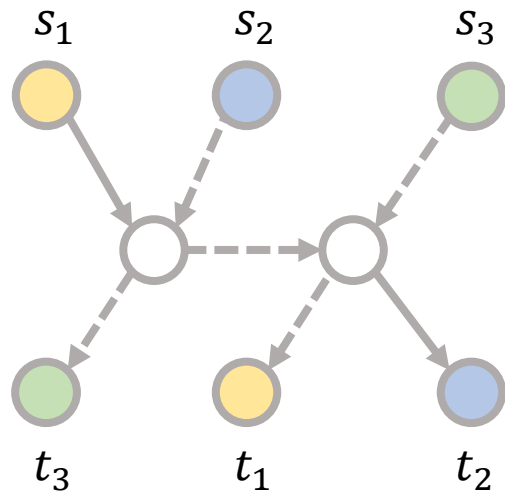


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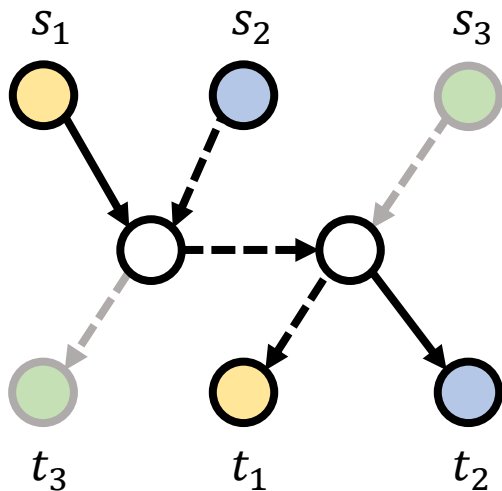


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that maximizes pairs  $s_i \rightarrow t_i$



[Cygan-Kortsarz-Nutov'13]

$k$ -Steiner Orientation is solvable in  $n^{O(k)}$  time

[Pilipczuk-Wahlstrom'16]

$k$ -Steiner Orientation is W[1]-hard

[Włodarczyk'19]

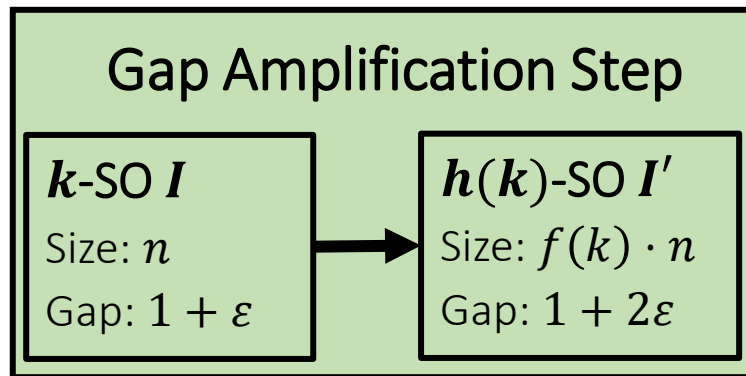
$k$ -Steiner Orientation is in W[1]

[Włodarczyk'19]

$k$ -Steiner Orientation is in W[1]-hard to  
approximate to within  $(\log k)^{o(1)}$  factor

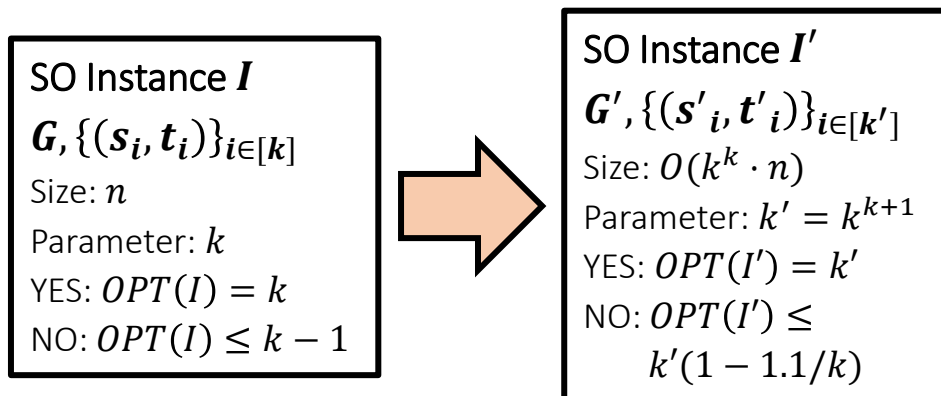
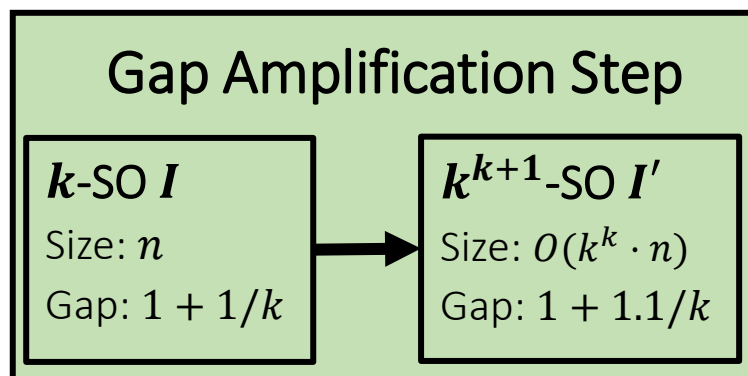
# Wlodarczyk's Gap Amplification Step

[Wlodarczyk'19]

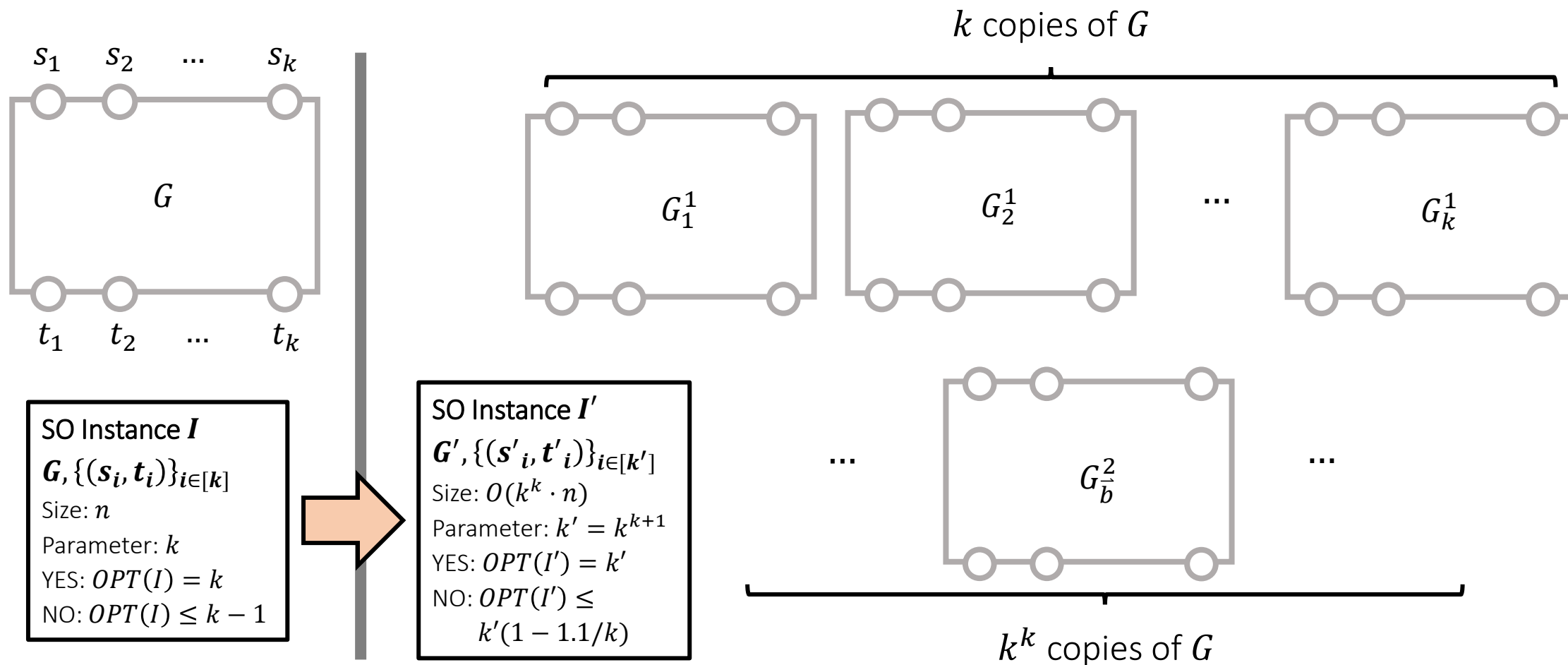


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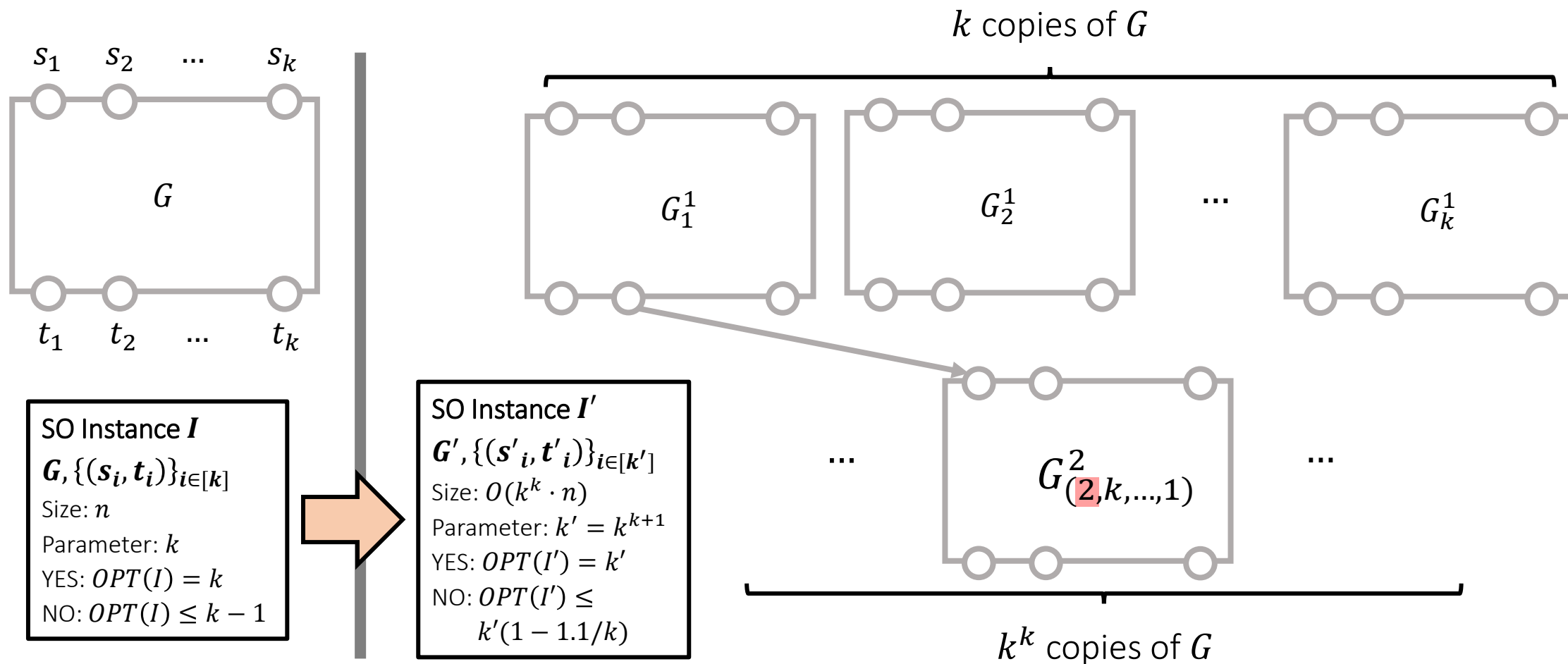
[Wlodarczyk'19]



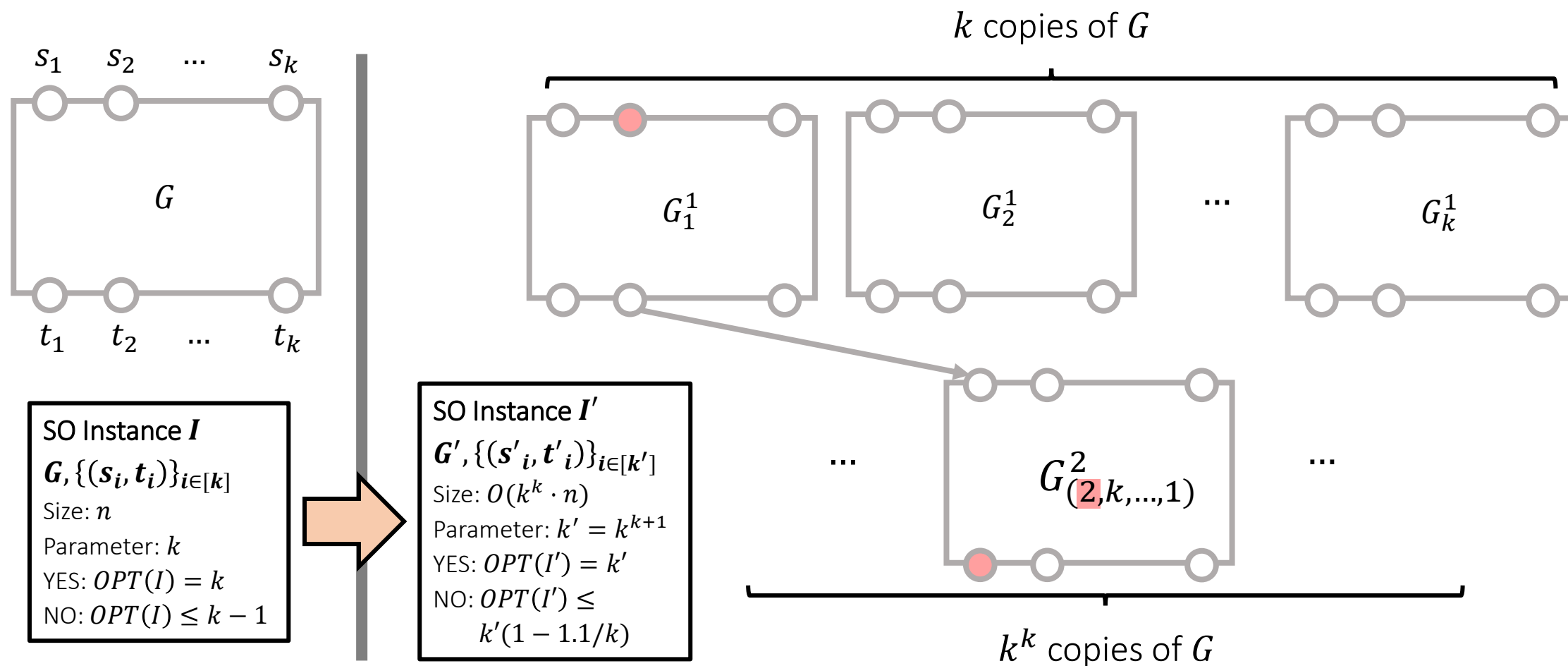
# Włodarczyk's Gap Amplification Step



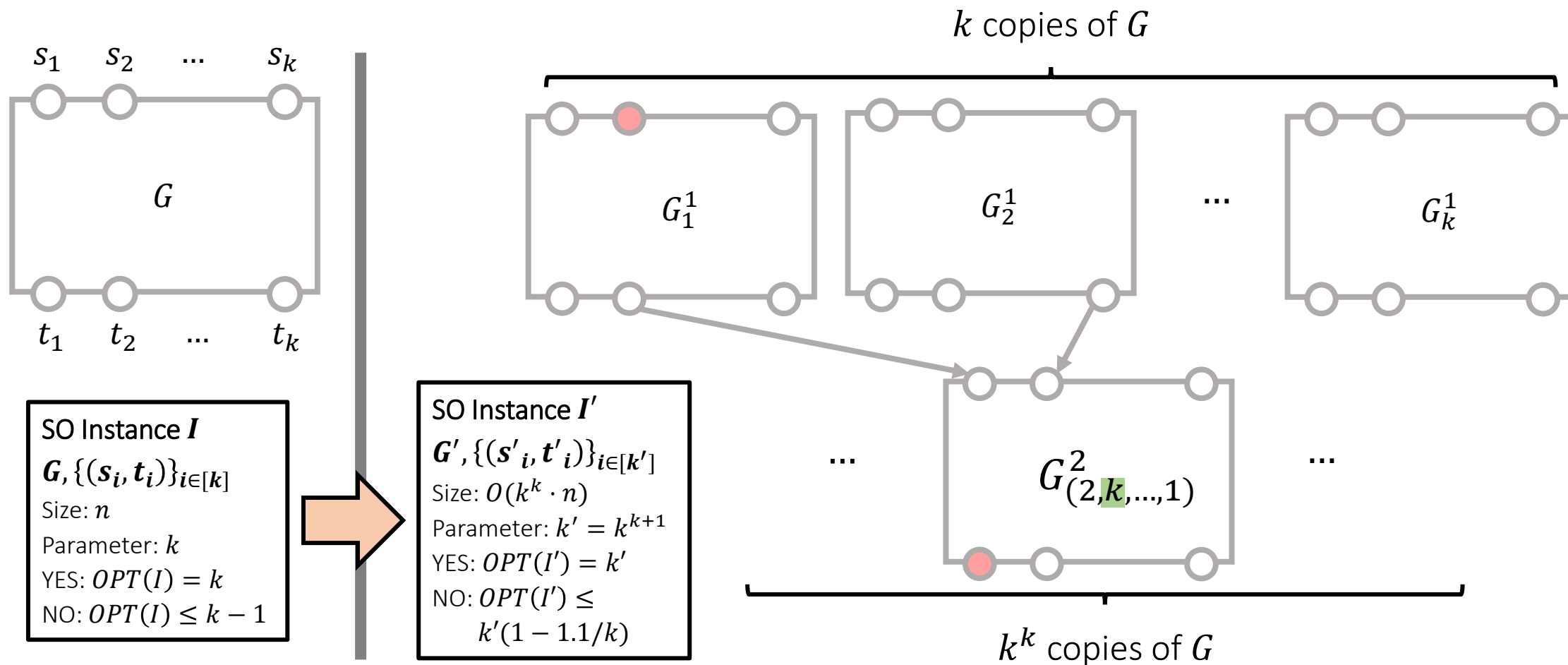
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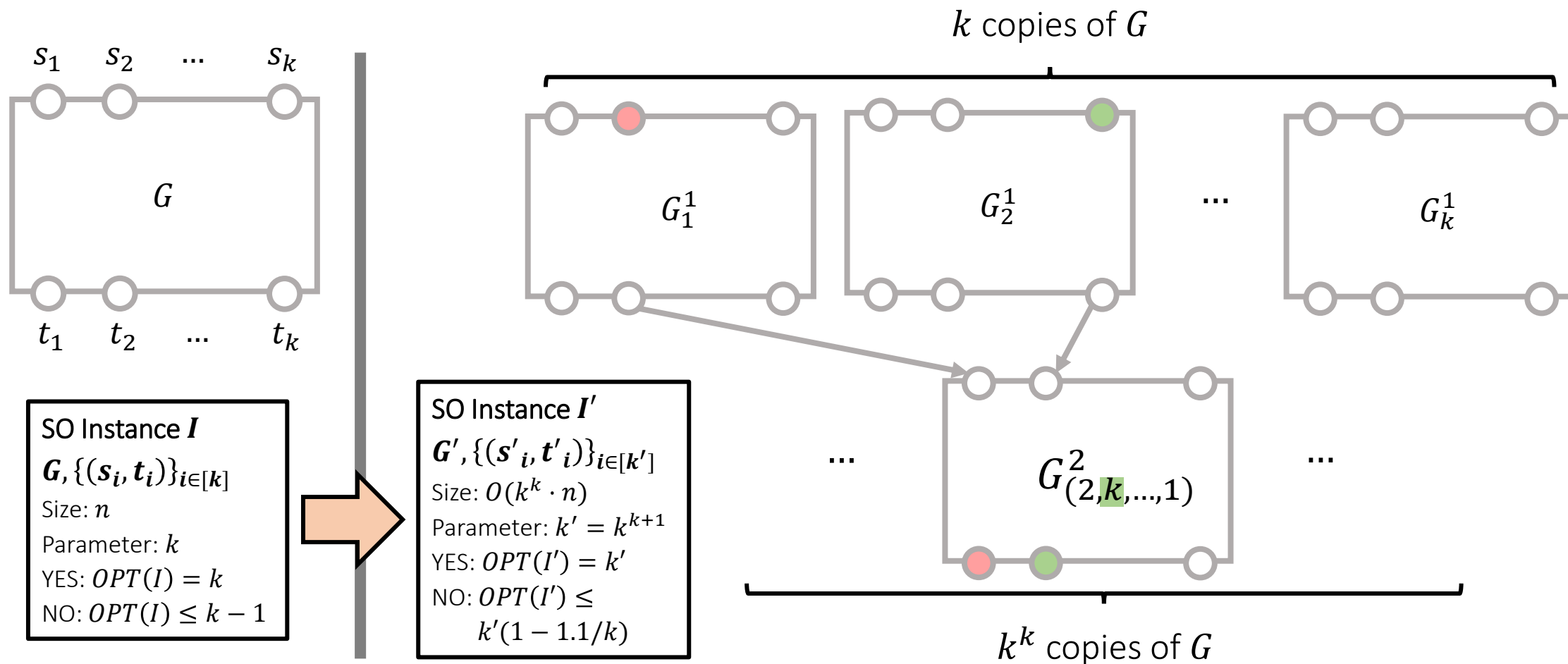
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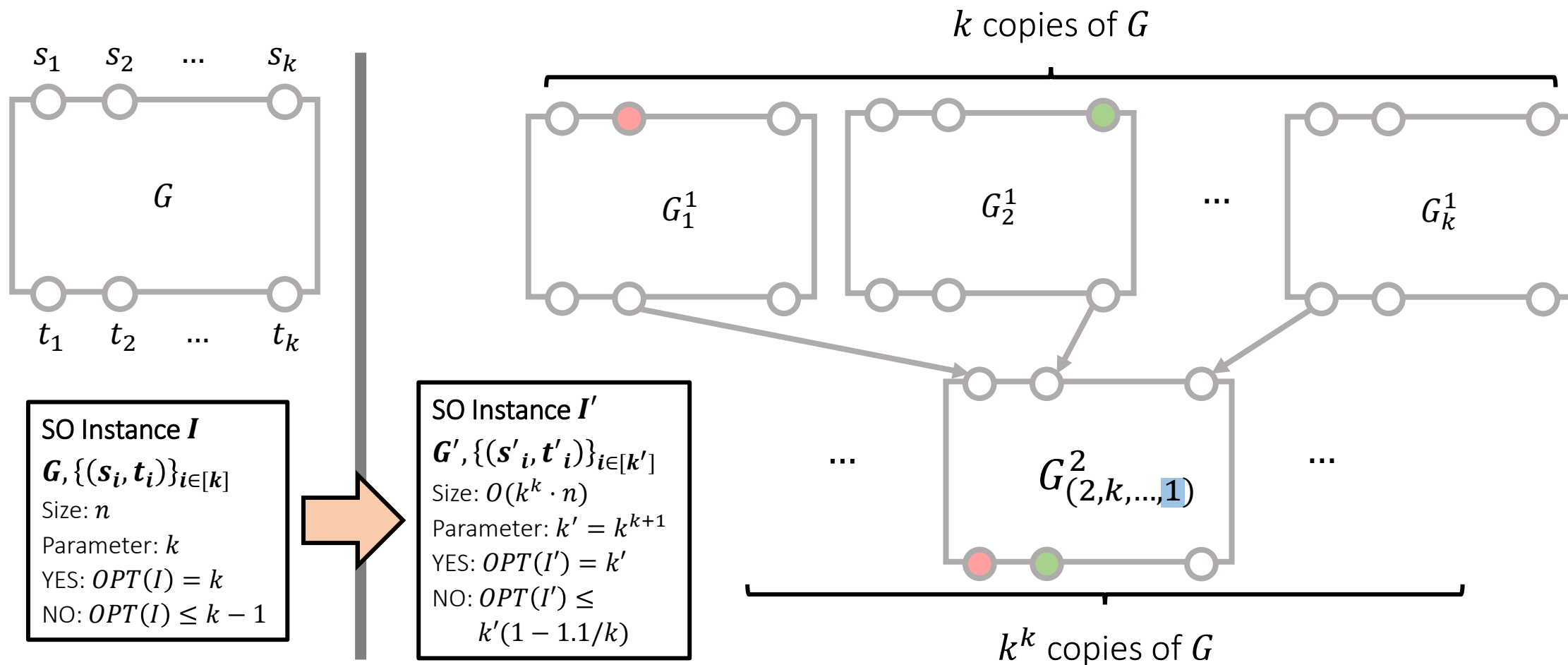


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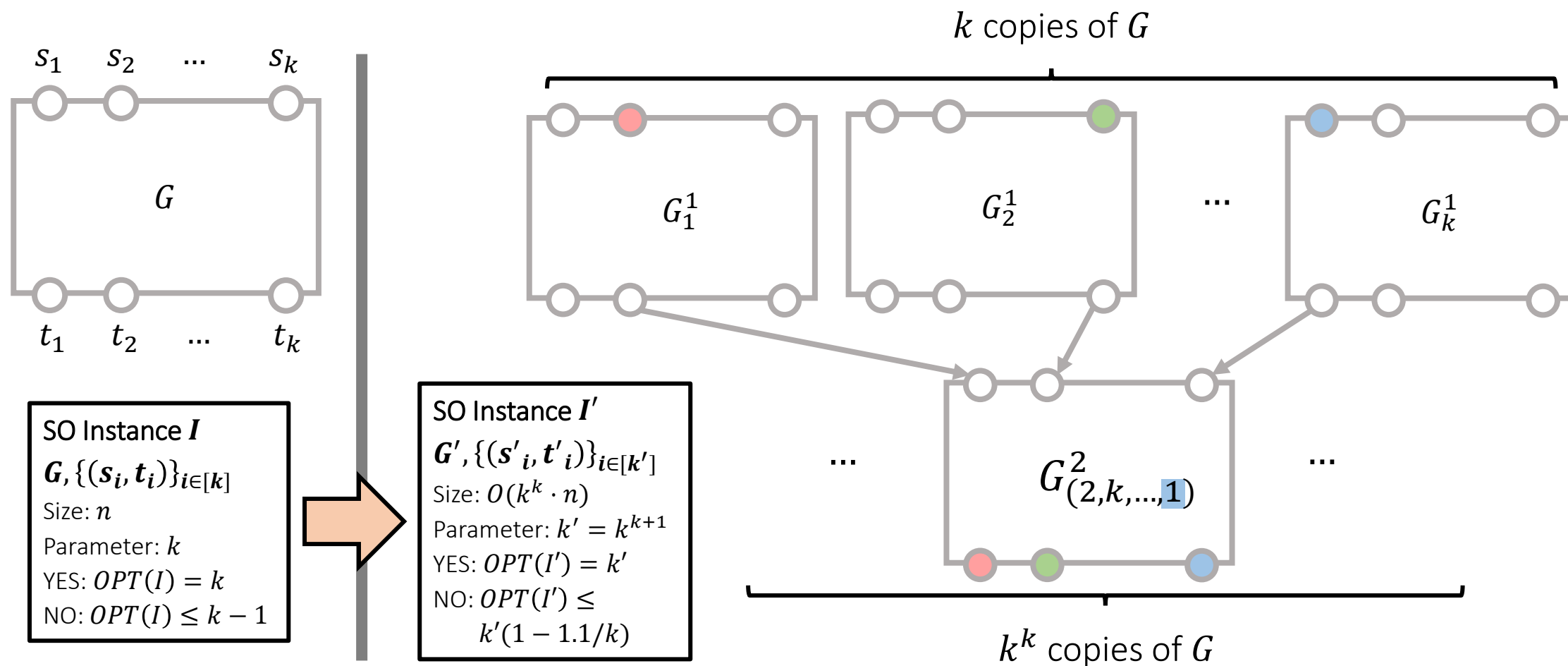




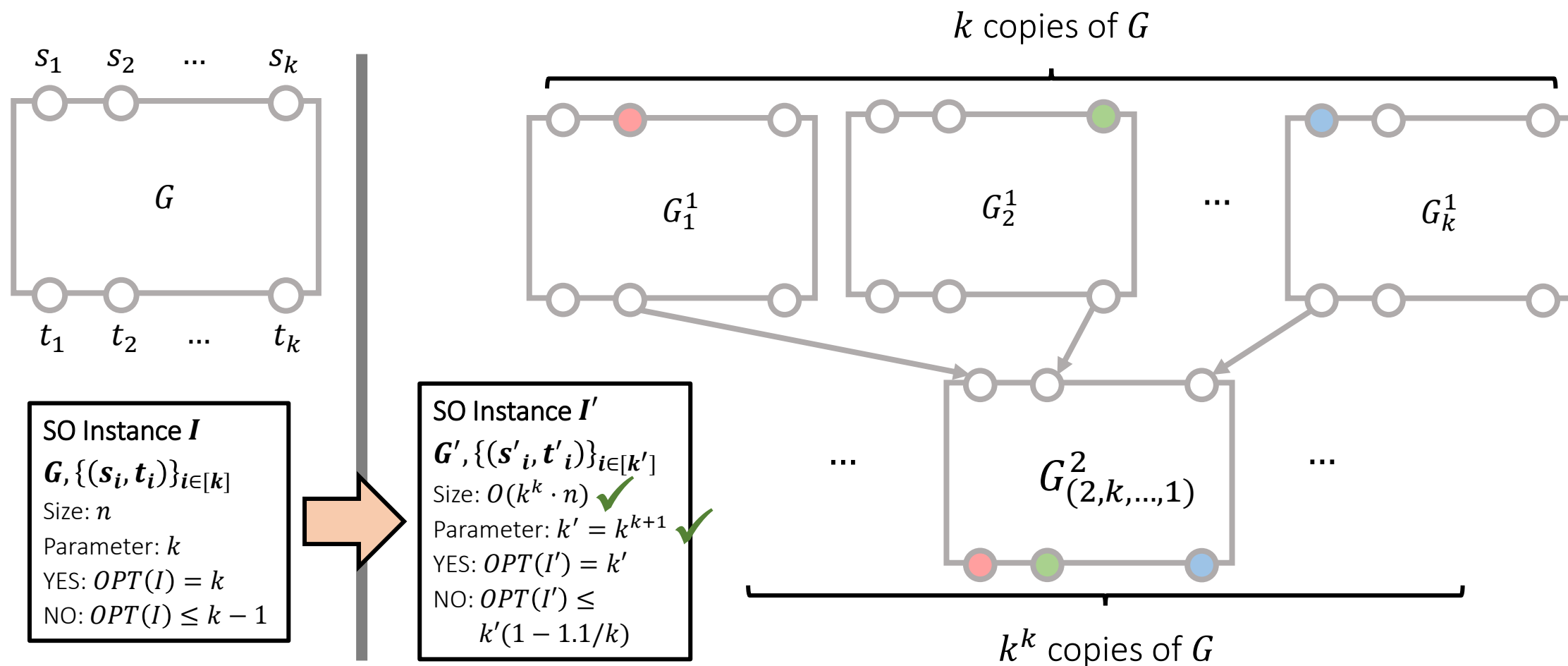
# Włodarczyk's Gap Amplification Step



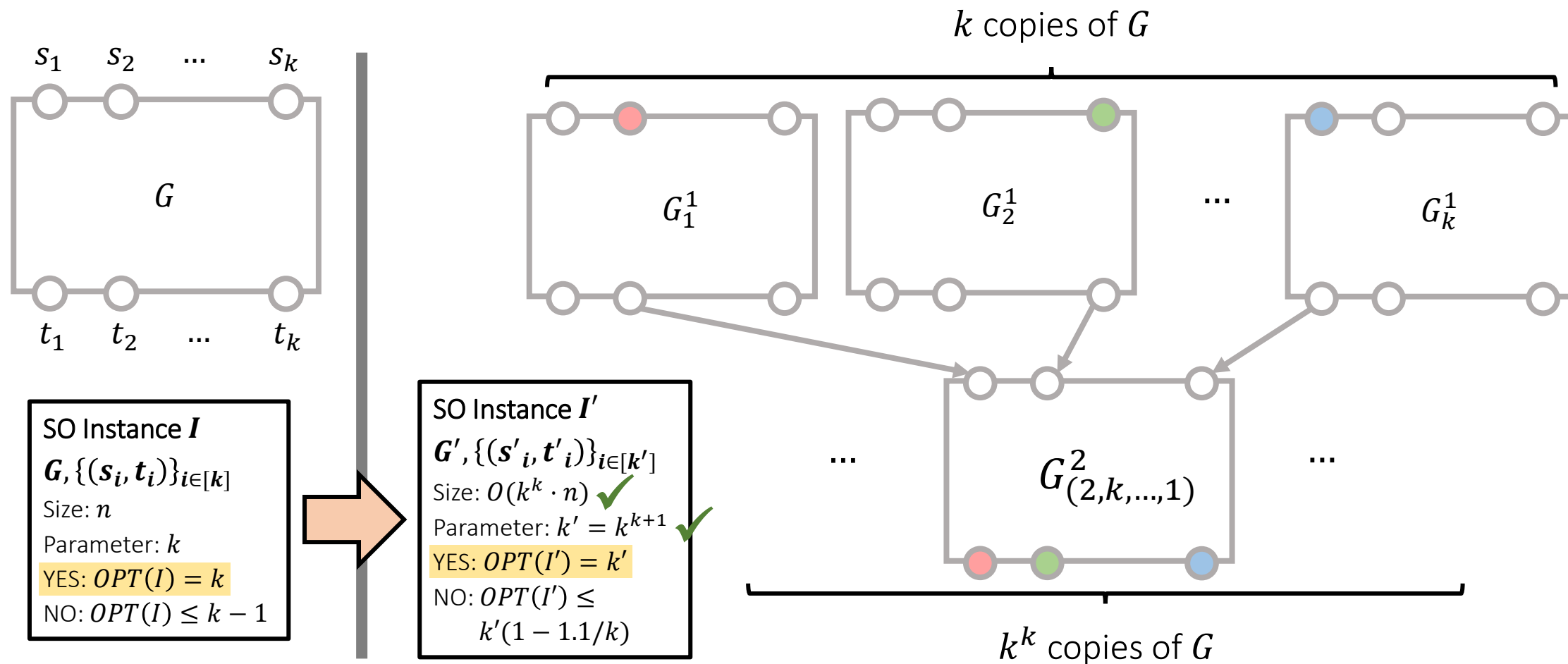
# Włodarczyk's Gap Amplification Step



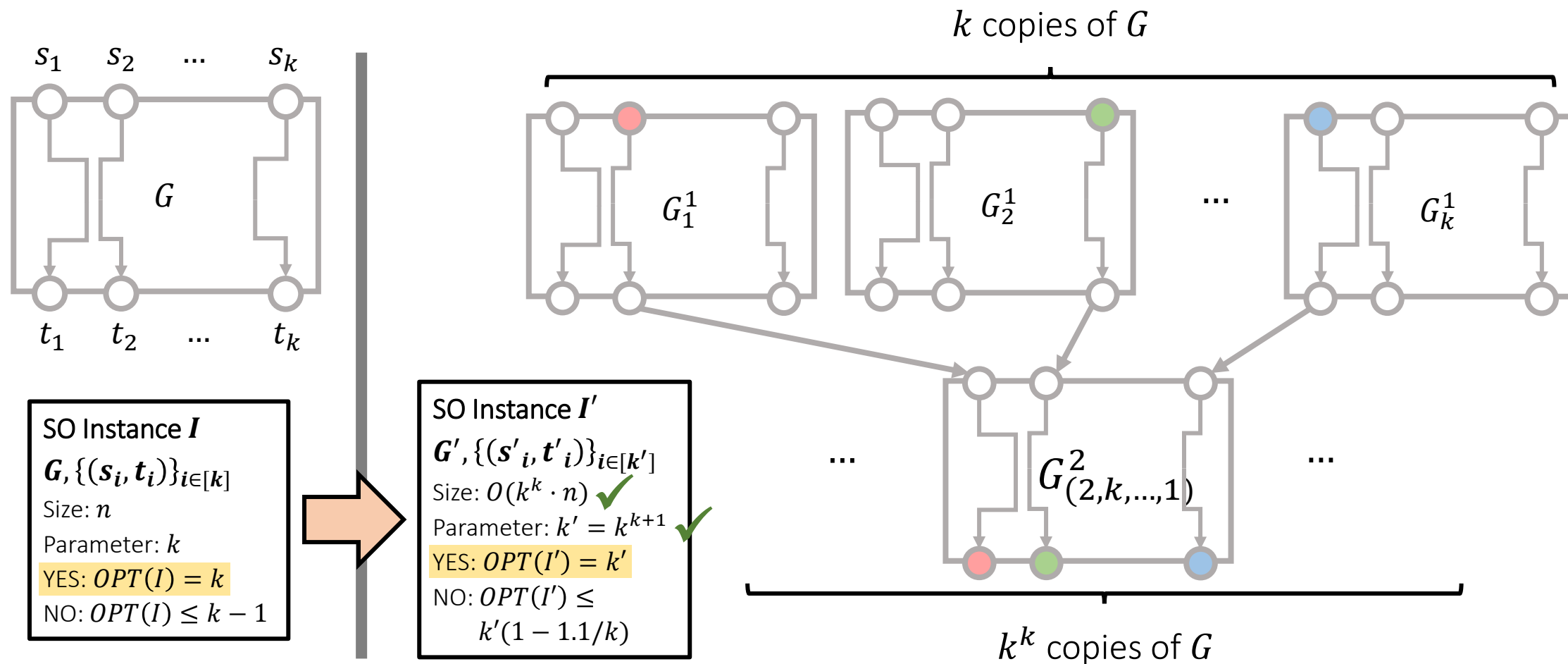
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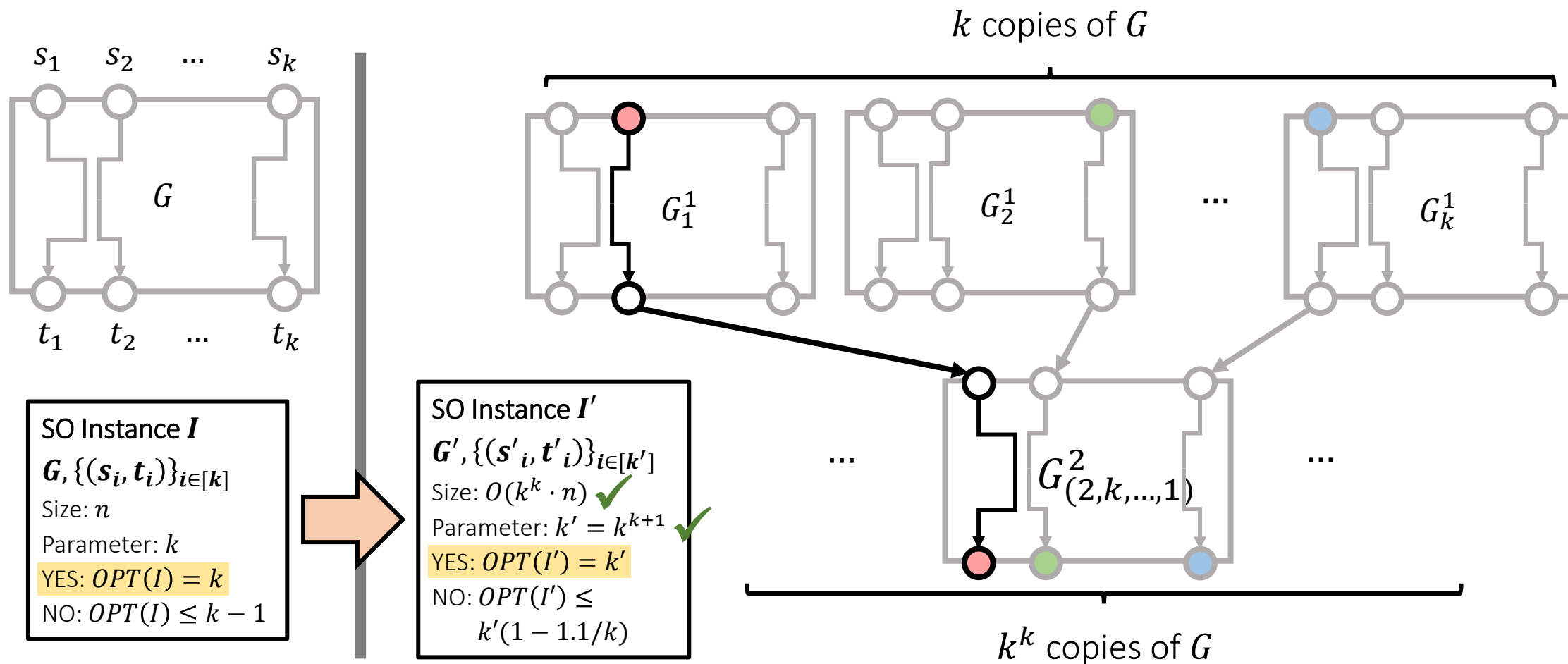
# Włodarczyk's Gap Amplification Step



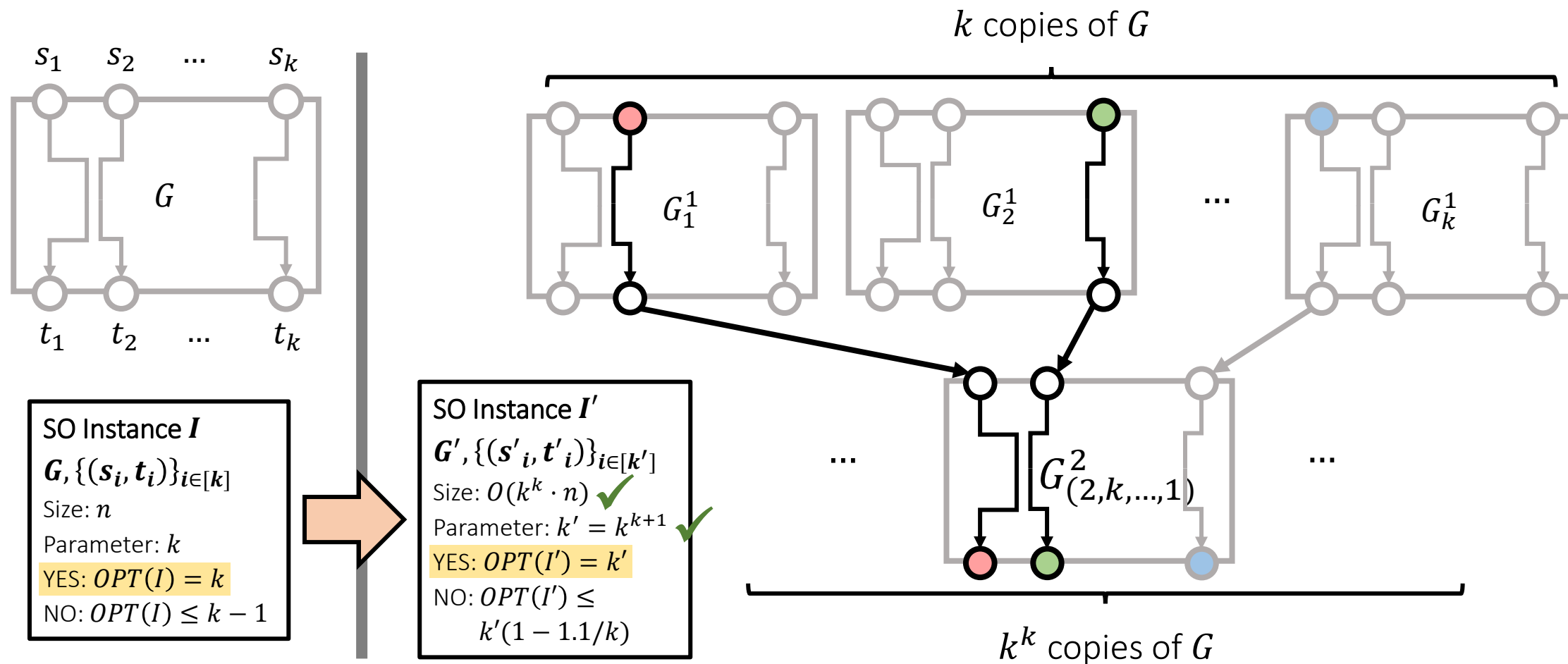
# Włodarczyk's Gap Amplification Step



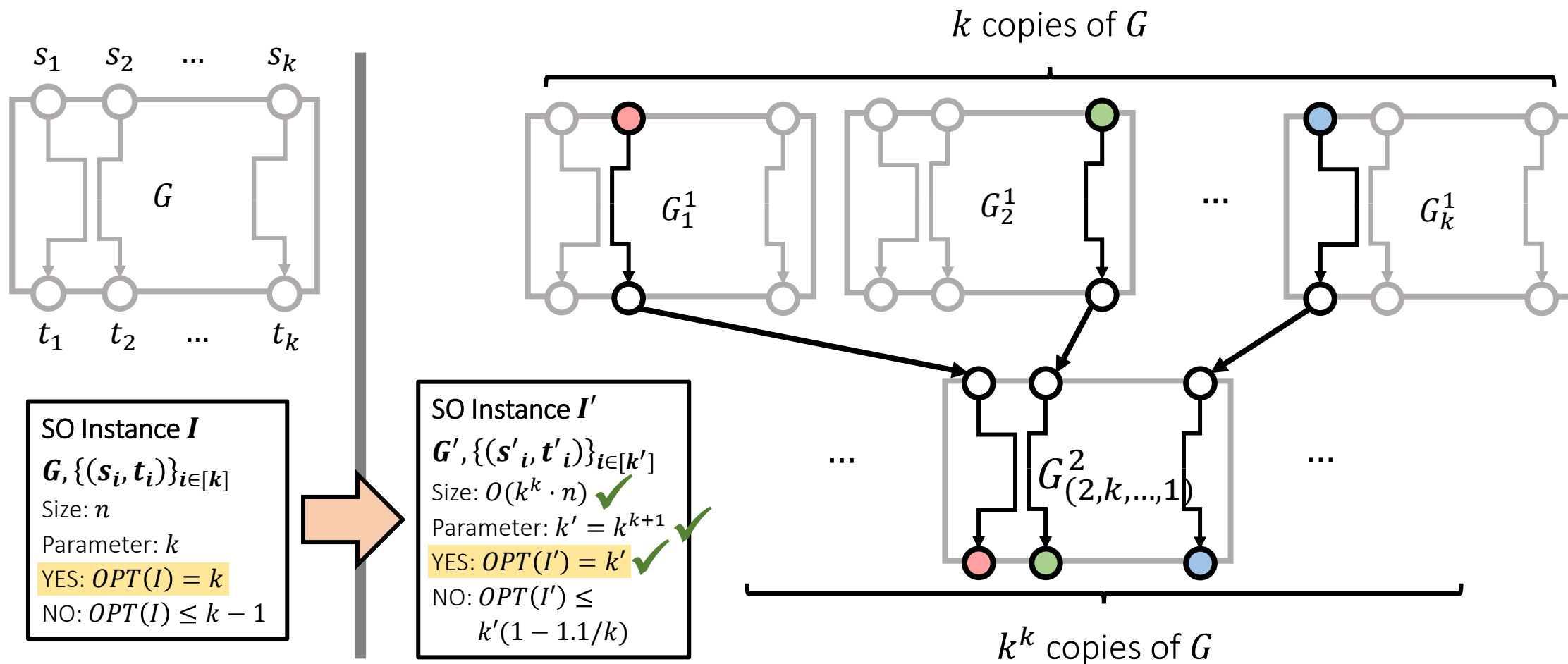
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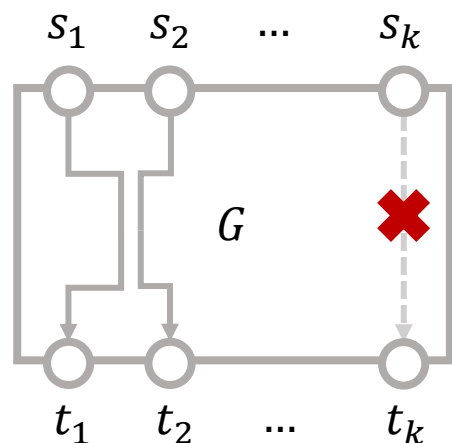


# Włodarczyk's Gap Amplification Step





# Włodarczyk's Gap Amplification Step



SO Instance  $I$

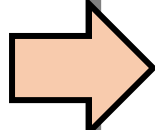
$G, \{(s_i, t_i)\}_{i \in [k]}$

Size:  $n$

Parameter:  $k$

YES:  $OPT(I) = k$

NO:  $OPT(I) \leq k - 1$



SO Instance  $I'$

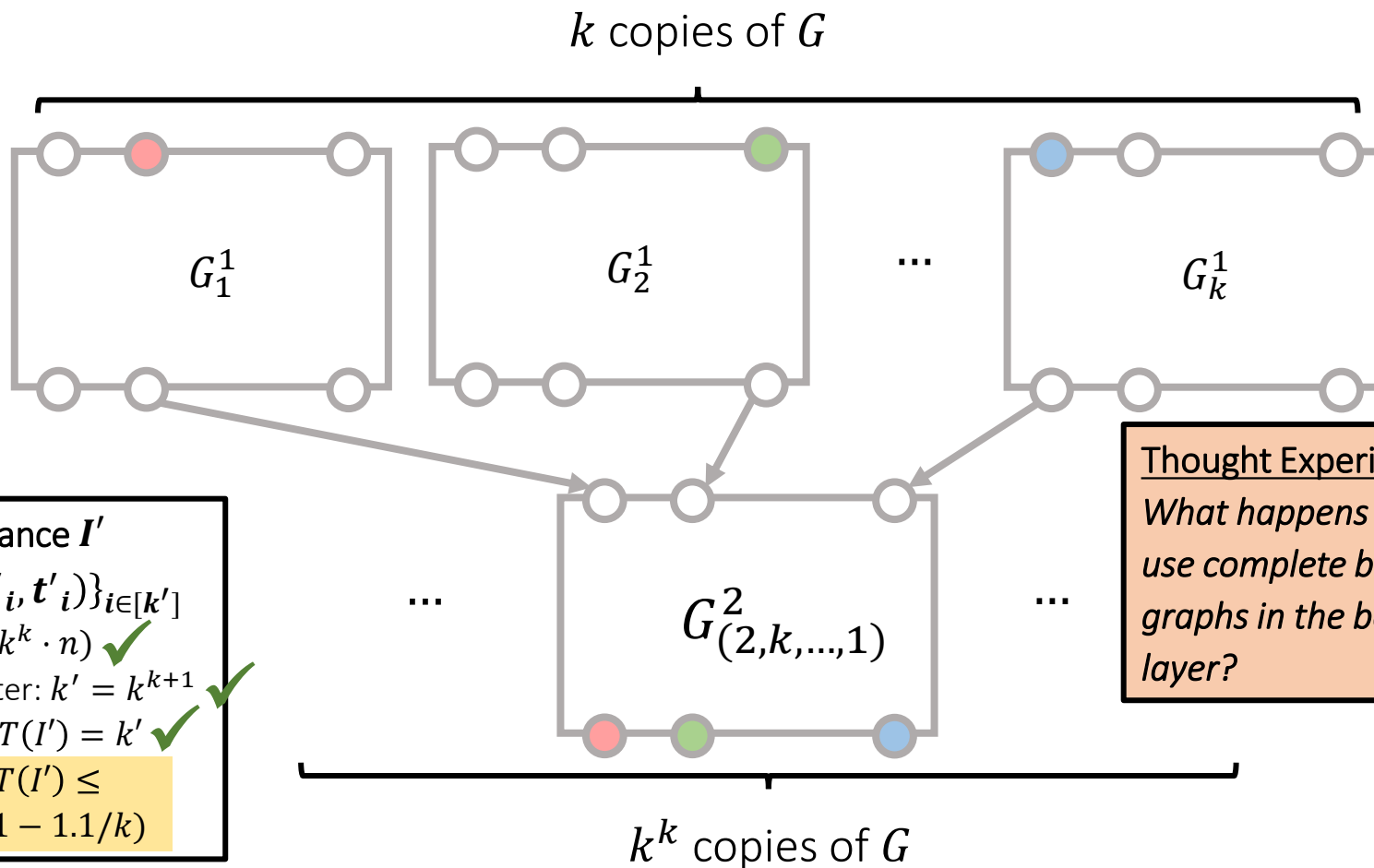
$G', \{(s'_i, t'_i)\}_{i \in [k']}$

Size:  $O(k^k \cdot n)$  ✓

Parameter:  $k' = k^{k+1}$  ✓

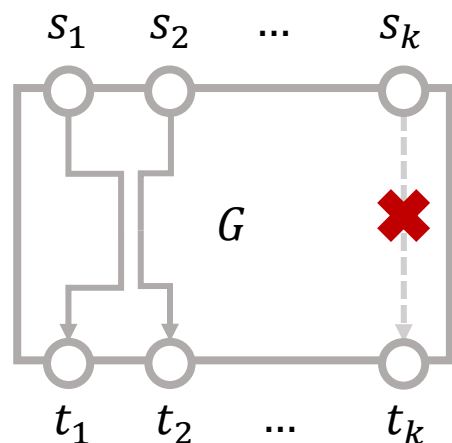
YES:  $OPT(I') = k'$  ✓

NO:  $OPT(I') \leq k'(1 - 1.1/k)$



Thought Experiment  
What happens if we use complete bipartite graphs in the bottom layer?

# Włodarczyk's Gap Amplification Step



SO Instance  $I$

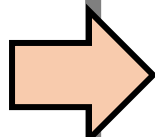
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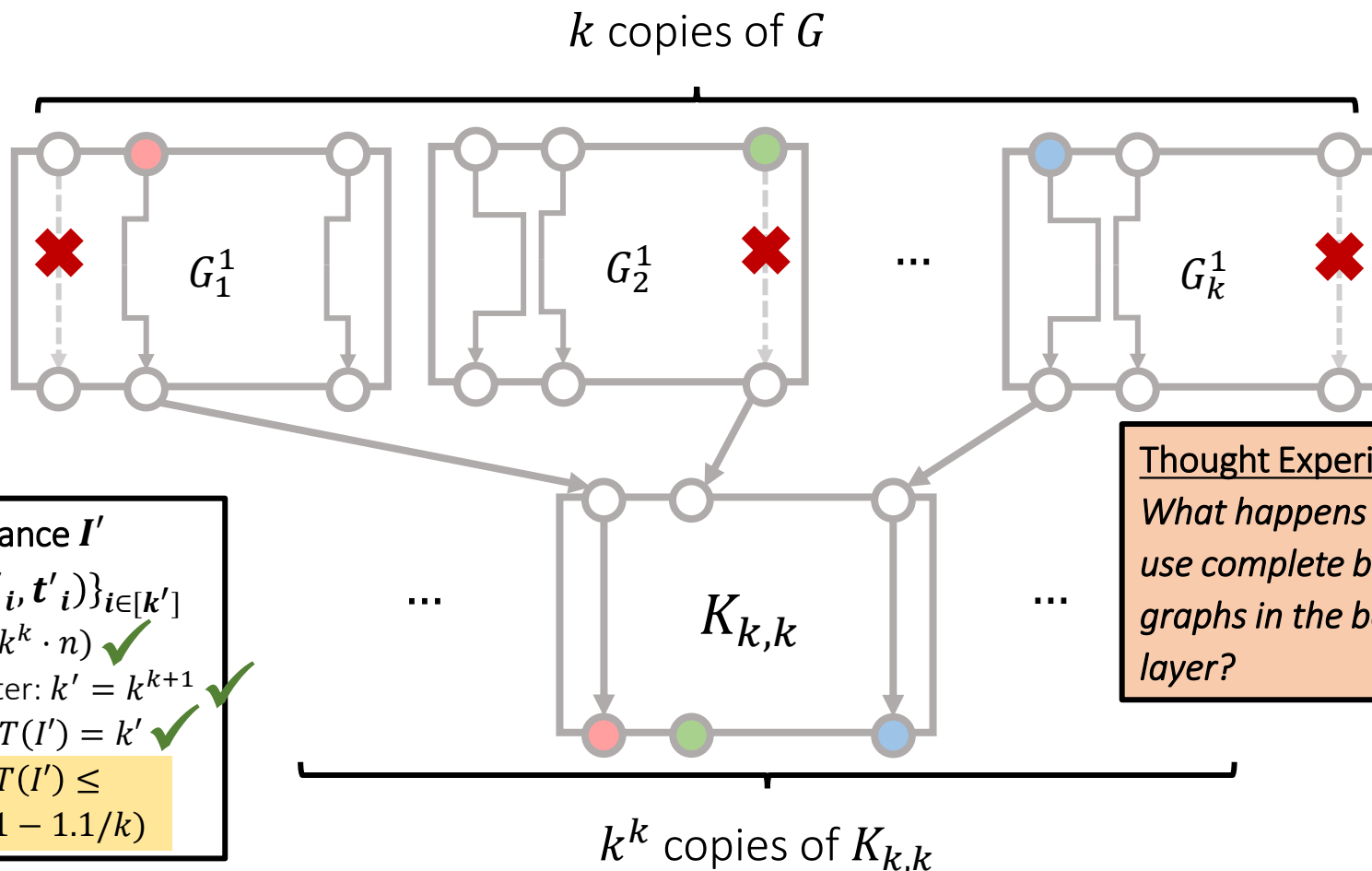
$G', \{(s'_i, t'_i)\}_{i \in [k']}$

Size:  $O(k^k \cdot n)$  ✓

Parameter:  $k' = k^{k+1}$  ✓

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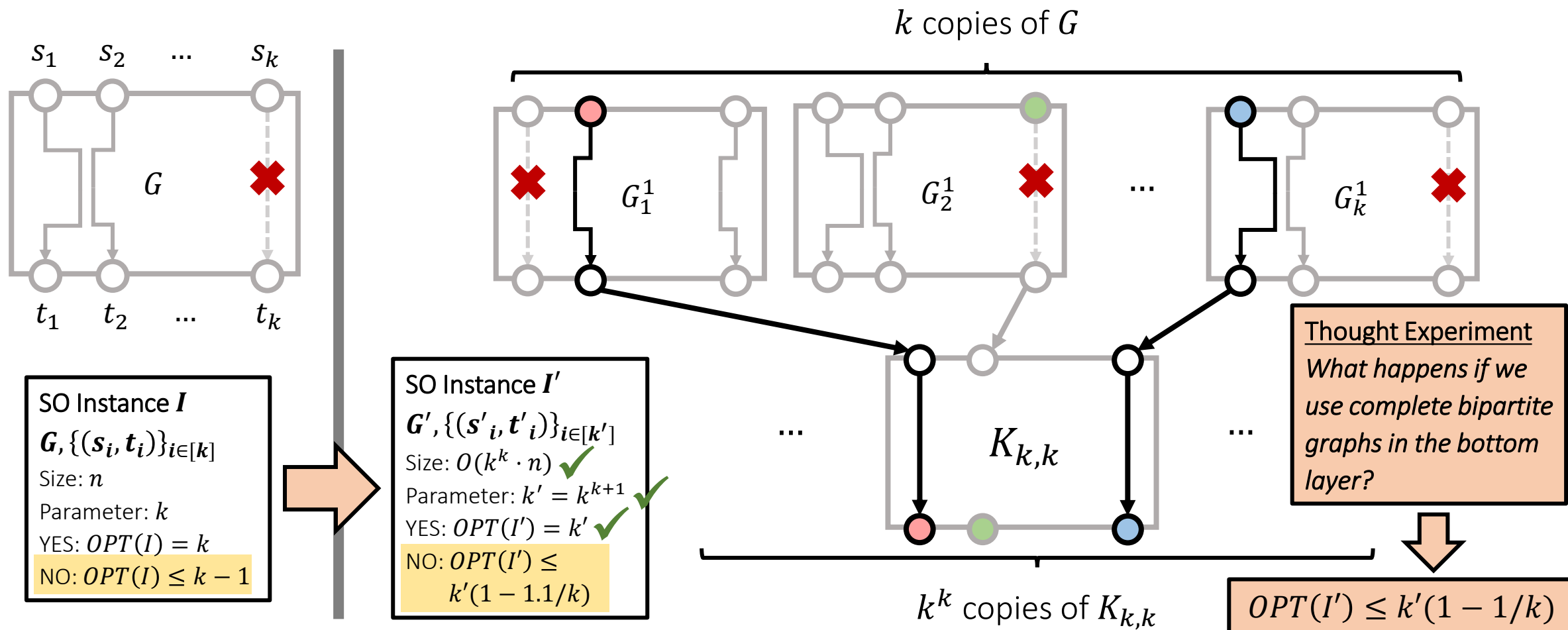
NO:  $OPT(I') \leq k'(1 - 1.1/k)$



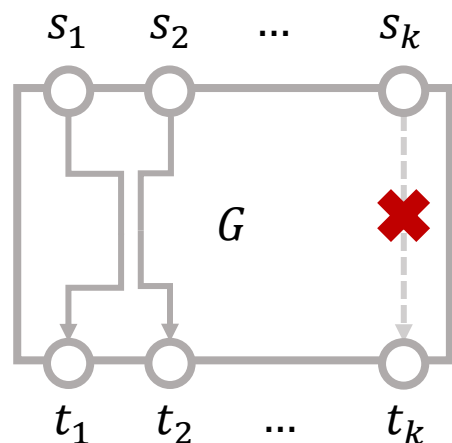
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# Włodarczyk's Gap Amplification Step



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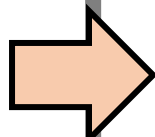
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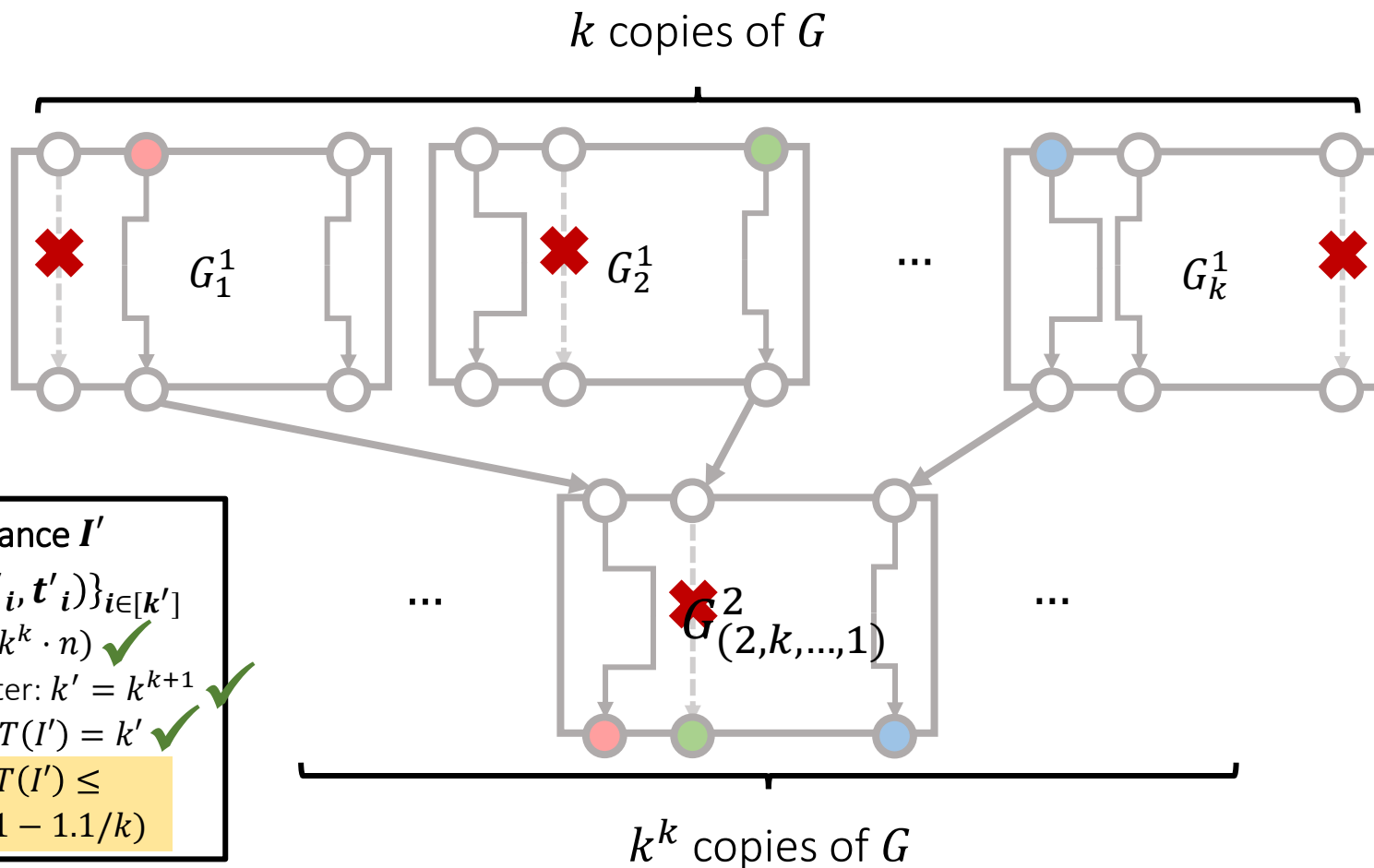
$G', \{(s'_i, t'_i)\}_{i \in [k']}$

Size:  $O(k^k \cdot n)$  ✓

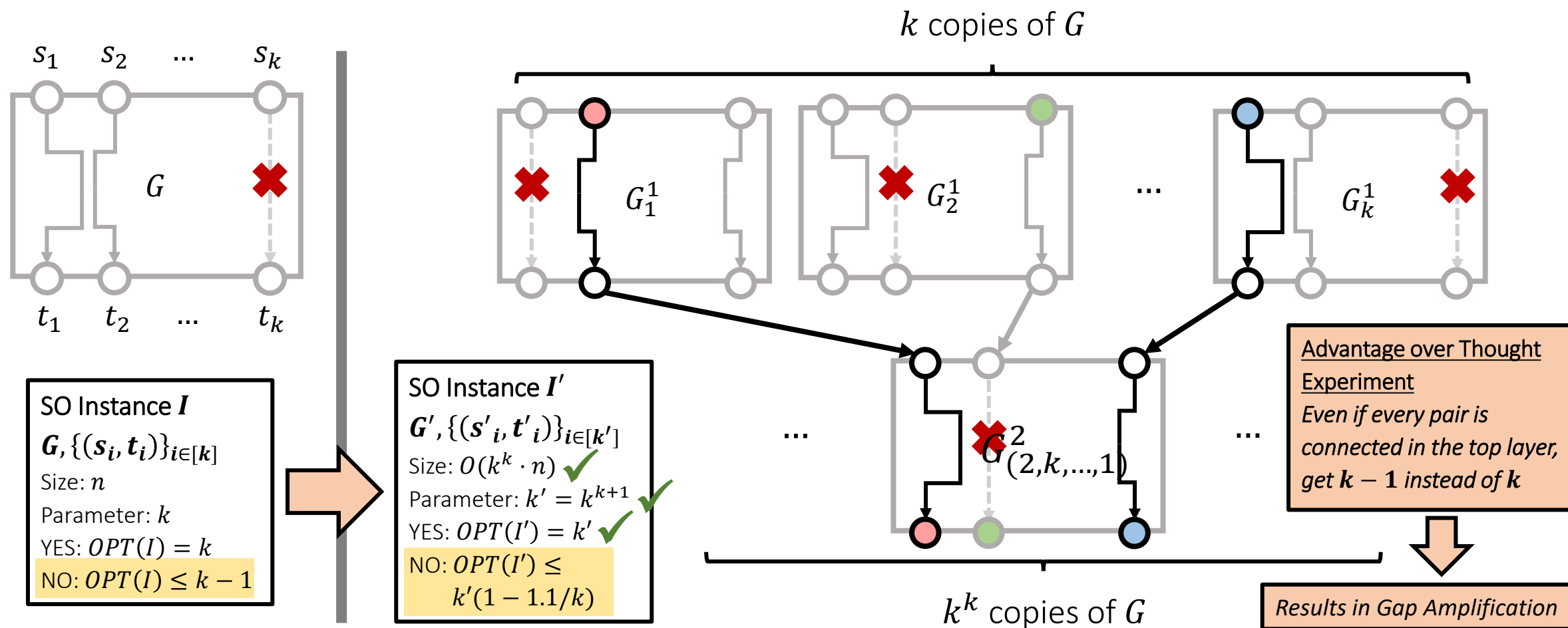
Parameter:  $k' = k^{k+1}$  ✓

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# Włodarczyk's Gap Amplification Step

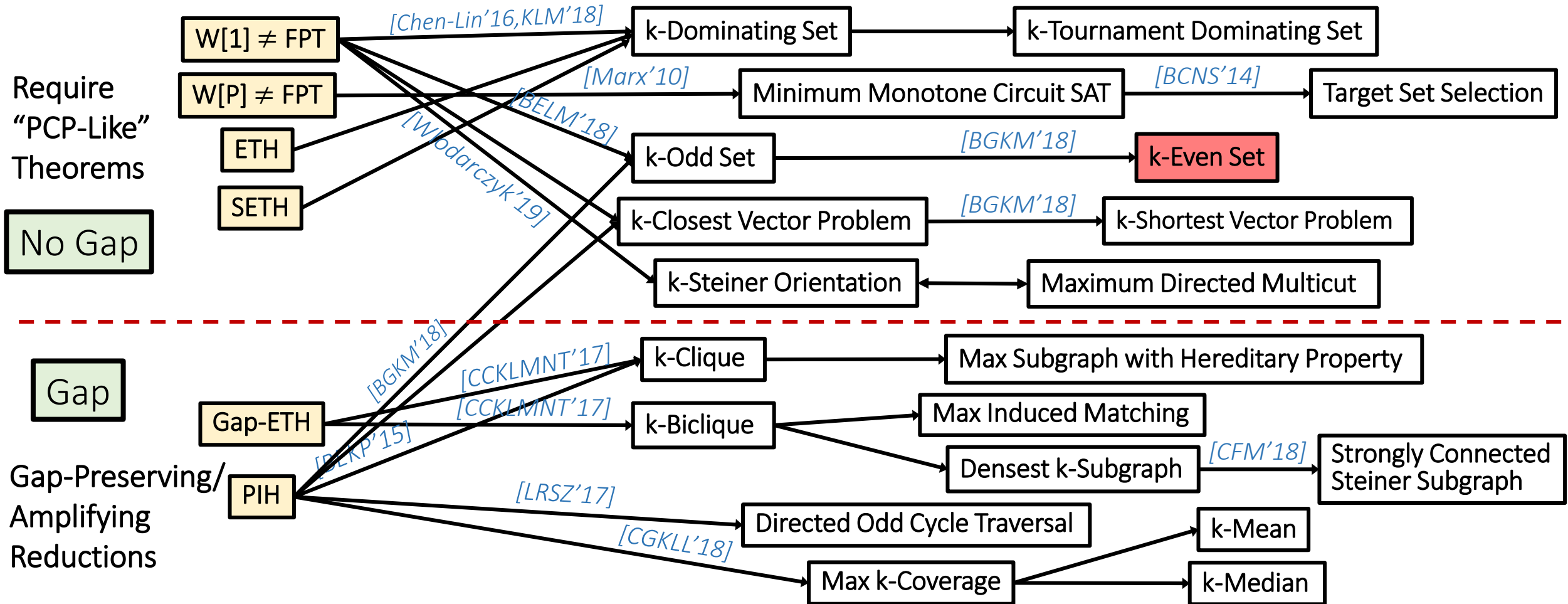


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# Concluding Remarks

- Useful not just for ruling out approximation algorithms

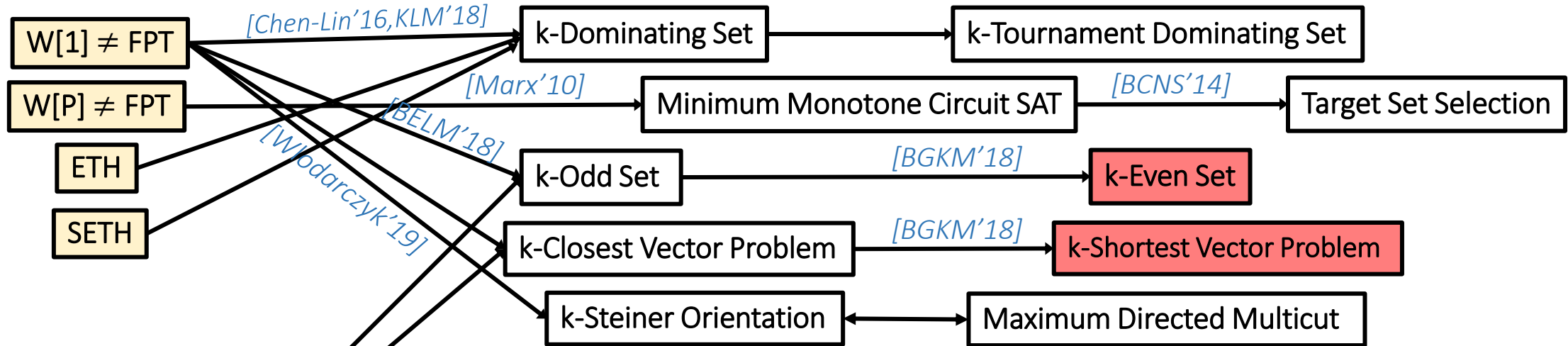
# Parameterized Inapproximability: *Recent Developments*



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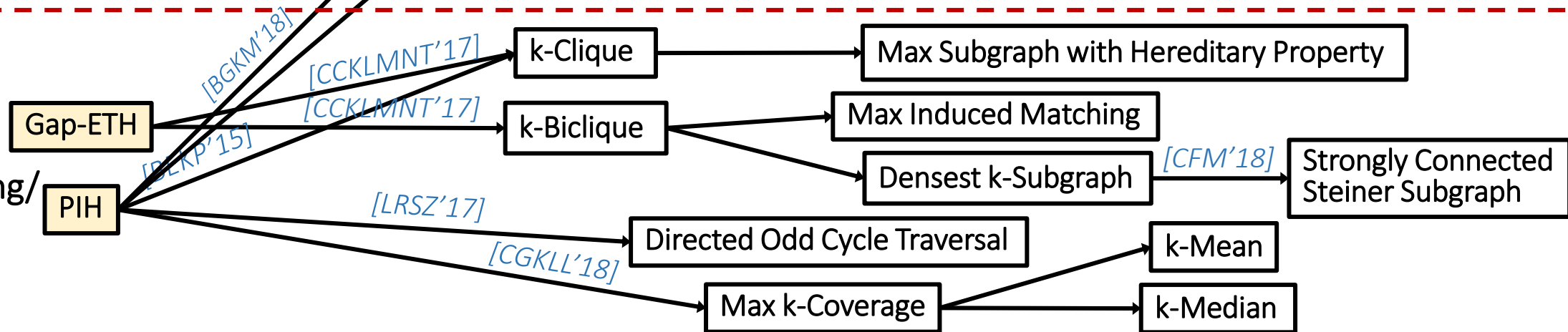
Require  
“PCP-Like”  
Theorems

No Gap



Gap

Gap-Preserving/  
Amplifying  
Reductions





# Concluding Remarks

- Useful not just for ruling out approximation algorithms
- Many open problems:
  - Directed Odd Cycle Traversal, Minimum  $k$ -Cut, ...
- W[1]-Completeness of Approximating  $k$ -Clique?
- W[2]-Completeness of Approximating  $k$ -Domset?
- Unify Gap-Producing Techniques?
- Try to understand the hypotheses better

# Complexity Assumptions

## Exponential Time Hypotheses

**Exponential time Hypothesis (ETH)** [Impagliazzo, Paturi'01]  
No  $2^{o(n)}$ -time algo can decide whether a 3CNF formula is satisfiable

**Strong ETH (SETH)** [Impagliazzo, Paturi'01]  
For any constant  $\varepsilon > 0$ , no  $O(2^{(1-\varepsilon)n})$ -time algorithm can decide whether a CNF formula is satisfiable

**Gap ETH (Gap-ETH)** [Dinur'16] [M, Raghavendra'16]  
For some constant  $\delta > 0$ , no  $2^{o(n)}$ -time algorithm can distinguish between a satisfiable CNF formula and one which is not even  $(1 - \delta)$ -satisfiable.

## Parameterized Complexity

**W[1]  $\neq$  FPT Assumption** [Downey, Fellows'92]  
For any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can decide whether a given graph contains a  $k$ -clique

**W[2]  $\neq$  FPT Assumption** [Downey, Fellows'92]  
For any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can decide whether a given graph contains a dominating set of size  $k$

**Parameterized Inapproximability Hypothesis (PIH)** [Lokshtanov, Ramanujan, Saurabh, Zehavi'17]  
For some  $\delta > 0$  and any function  $f$ , no  $f(k)n^{O(1)}$ -time algo can distinguish between a satisfiable 2CSP instance with  $k$  variables and alphabet size  $n$  and one which is not even  $(1 - \delta)$ -satisfiable.

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Equivalence?

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Equivalence?

---

THANK YOU

# Main References

*[Chalermsook-Cygan-Kortsarz-Laeckhanukit-Manurangsi-Nanongkai-Trevisan'17]*

From Gap-ETH to FPT-Inapproximability: Clique, Dominating Set, and More. *FOCS'17*

*[Karthik-Laeckhanukit-Manurangsi'18]*

On the parameterized complexity of approximating dominating set. *STOC'18*

*[Włodarczyk'19]*

*Inapproximability within  $W[1]$ : the case of Steiner Orientation. arXiv:1907.06529.*