

# Parameterized Algorithms

Lecture 2: Introduction cont...

May 15, 2020

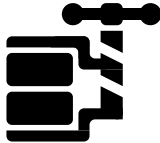
Max-Planck Institute for Informatics, Germany.

Recall....

## VERTEX COVER

- **Input** : Graph  $G$  on  $n$  vertices and integer  $k$
- **Parameter** :  $k$
- **Output** :  $S \subseteq V(G)$  such that  $G - S$  is **edgeless** and  $|S| \leq k$ .

# ITERATIVE COMPRESSION



Input

A graph  $G = (V, E)$  with  $n$  vertices,  $m$  edges, and  $k$ .

Is there a vertex cover of size at most  $k$ ?

Question

VERTEX COVER

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A graph  $G = (V, E)$  with  $n$  vertices,  $m$  edges, and  $k$ .

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Question



A vertex cover of size  $(k+1)$ .

# VERTEX COVER

Input

A graph  $G$  with a vertex cover of size  $k+1$ .

Is there a vertex cover of size at most  $k$ ?

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A vertex cover of size  $(k+1)$ .

Let us “guess” how a vertex cover of size at most  $k$  interacts with this one.

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Input

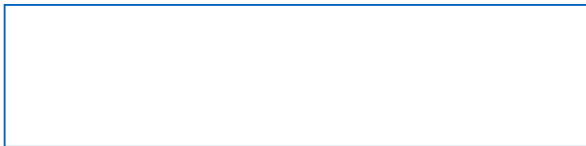
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Is there a vertex cover of size at most  $k$ ?

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A vertex cover of size  $(k+1)$ .



# VERTEX COVER

Input

A graph  $G$  with a vertex cover of size  $k+1$ .

Is there a vertex cover of size at most  $k$ ?

Question



A vertex cover of size  $(k+1)$ .

Can there be an edge between  
two red vertices?

# VERTEX COVER

Input

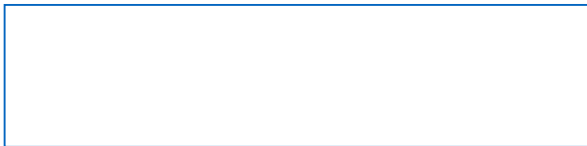
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Is there a vertex cover of size at most  $k$ ?

Question



A vertex cover of size  $(k+1)$ .



# VERTEX COVER

Input

A graph  $G$  with a vertex cover of size  $k+1$ .

Is there a vertex cover of size at most  $k$ ?

Question



A vertex cover of size  $(k+1)$ .

Now we need to make up for the work that the red vertices were doing.

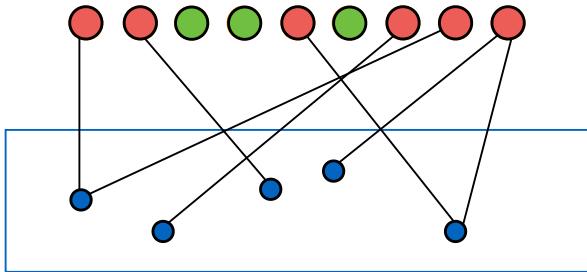
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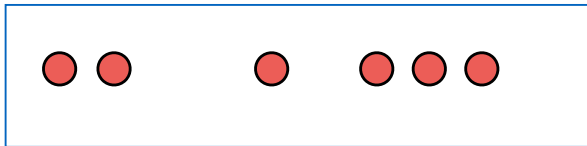
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VERTEX COVER



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The first  $k+2$  vertices in  $G$ .

# VERTEX COVER

Input

A graph  $G = (V, E)$  with  $n$  vertices,  $m$  edges, and  $k$ .

Is there a vertex cover of size at most  $k$ ?

Question



The first  $k+2$  vertices in  $G$ . It has an easy vertex cover of size  $k+1$ .

# VERTEX COVER

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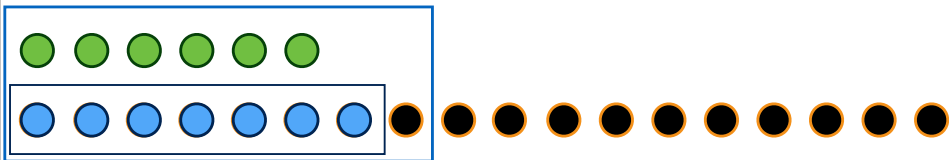
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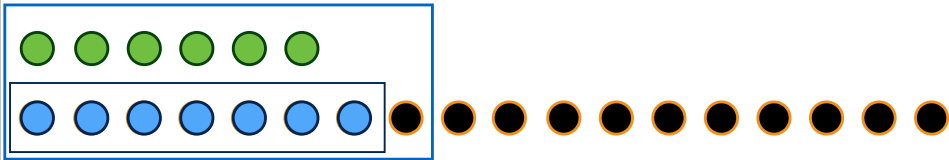


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A graph  $G = (V, E)$  with  $n$  vertices,  $m$  edges, and  $k$ .

Is there a vertex cover of size at most  $k$ ?

Question



The first  $k+2$  vertices in  $G$ . It has an easy vertex cover of size  $k+1$ .



Compress again... rinse, repeat.

# VERTEX COVER

Input

A graph  $G = (V, E)$  with  $n$  vertices,  $m$  edges, and  $k$ .

Is there a subset of vertices  $S$  of size at most  $k$  that intersects all the edges?

Question

We have a  $O^*(2^k)$  algorithm for Vertex Cover.

# VERTEX COVER

Recall....

## FEEDBACK VERTEX SET

- **Input** : Graph  $G$  on  $n$  vertices and integer  $k$
- **Parameter** :  $k$
- **Output** :  $S \subseteq V(G)$  such that  $G - S$  is **acyclic** and  $|S| \leq k$ .

## Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question



A Feedback Vertex Set of size  $(k+1)$ .

Let us “guess” how a FVS of size at most  $k$  interacts with this one.

## FEEDBACK VERTEX SET

Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

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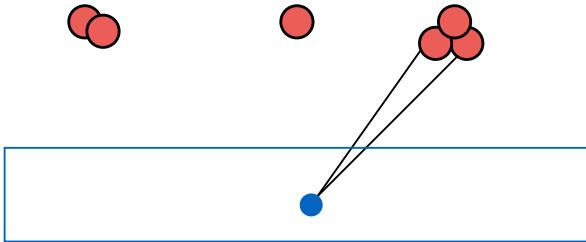
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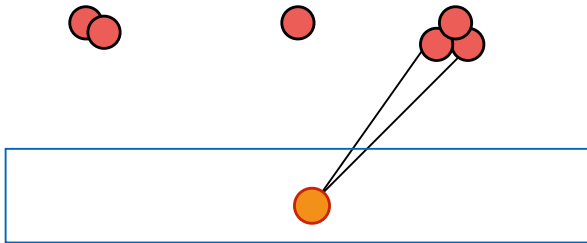
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FEEDBACK VERTEX SET

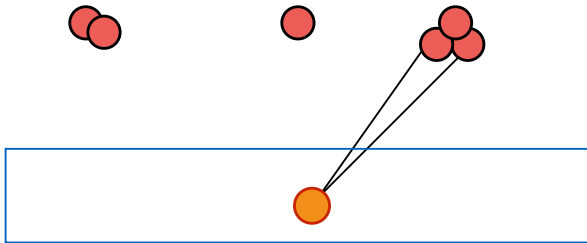


Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

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Question



A vertex with two neighbors in the same component is forced.

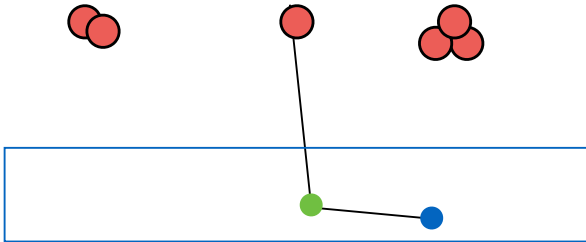
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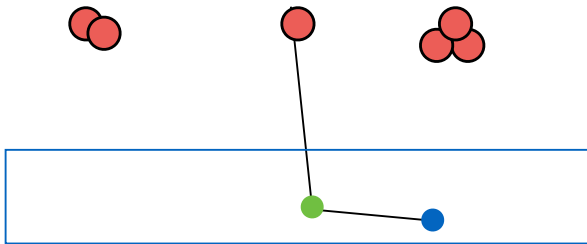
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Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

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Question



A leaf that has exactly one neighbor above can be preprocessed.

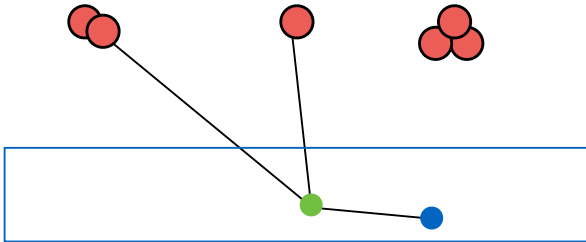
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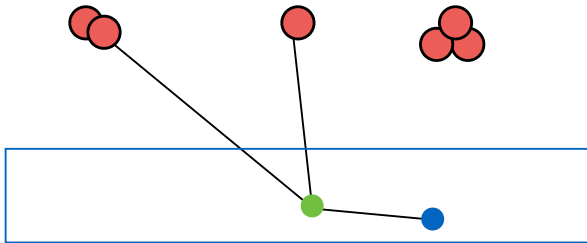
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A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

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Question



...a leaf with at least two neighbors in different components.

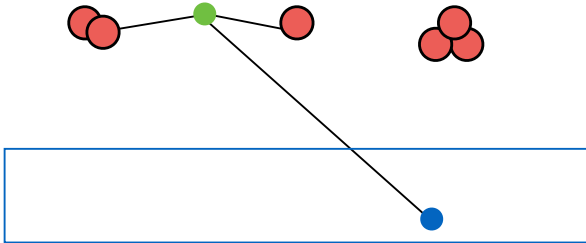
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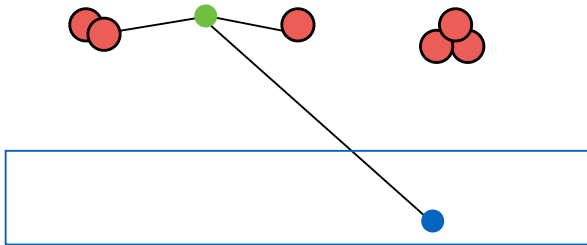
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## Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question



The leaf merges two components when we don't include it.

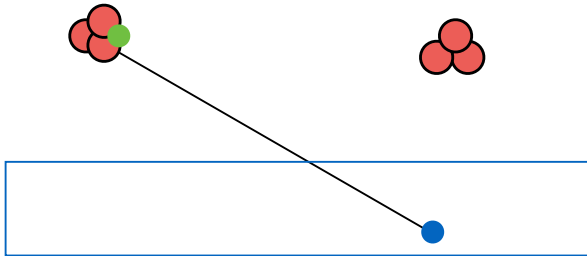
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Input

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FEEDBACK VERTEX SET

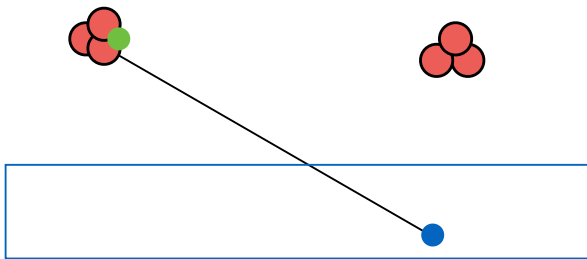


Input

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Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question



The number of components “on top” decreases.

FEEDBACK VERTEX SET

## Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question

Start with a leaf.

Two neighbors in one component: **forced**.

At most one neighbor above: **preprocess**.

At least two neighbors, all in different components above: **branch**.

FEEDBACK VERTEX SET

Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question

FEEDBACK VERTEX SET

## Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question

Let  $t$  denote the number of components among the red vertices. Let  $w = (k+t)$ .

## FEEDBACK VERTEX SET

## Input

A graph on  $n$  vertices,  $m$  edges and an integer  $k$ .

Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

## Question

Let  $t$  denote the number of components among the red vertices. Let  $w = (k+t)$ .

Include  $v... k$  drops by 1  
Exclude  $v... t$  drops by at least 1

## FEEDBACK VERTEX SET

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Either way,  $w$  drops by at least one.

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Running time:  $2^w = 2^{(k+t)}$

FEEDBACK VERTEX SET



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Running time:  $2^w = 2^{(k+t)} \leq 2^{k+k} \leq 4^k$

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## Input

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Running time:  $2^w = 2^{(k+t)} \leq 2^{k+k} \leq 4^k$

Overall Running Time...

FEEDBACK VERTEX SET

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Is there a subset of at most  $k$  vertices whose removal makes the graph acyclic?

Question

Either way,  $w$  drops by at least one.

Running time:  $2^w = 2^{(k+t)} \leq 2^{k+k} \leq 4^k$

Overall Running Time...

$$\sum_{i=1}^k \binom{k}{i} 4^i = 5^k$$

FEEDBACK VERTEX SET

Input

A tournament  $T$  on  $n$  vertices and an integer  $k$ .

Is there a subset of  $k$  arcs that can be reversed to make the tournament acyclic?

Question

This implies an  $O(5^k)$  algorithm for FVS.

FEEDBACK VERTEX SET

# Bipartite Deletion

Also Known as ODD CYCLE TRANSVERSAL

- **Input** : Graph  $G$  on  $n$  vertices and integer  $k$
- **Parameter** :  $k$
- **Output** :  $S \subseteq V(G)$  such that  $G - S$  is **Bipartite** and  $|S| \leq k$ .

Bipartite Graphs:

- Are **2**-colorable
- Have no odd cycle

# BIPARTITE DELETION

Solution based on iterative compression:

## ⑥ Step 1:

Solve the **annotated problem** for bipartite graphs:

Given a **bipartite** graph  $G$ , two sets  $B, W \subseteq V(G)$ , and an integer  $k$ , find a set  $S$  of at most  $k$  vertices such that  $G \setminus S$  has a 2-coloring where  $B \setminus S$  is black and  $W \setminus S$  is white.

# BIPARTITE DELETION

Solution based on iterative compression:

## ⑥ Step 1:

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Given a **bipartite** graph  $G$ , two sets  $B, W \subseteq V(G)$ , and an integer  $k$ , find a set  $S$  of at most  $k$  vertices such that  $G \setminus S$  has a 2-coloring where  $B \setminus S$  is black and  $W \setminus S$  is white.

## ⑥ Step 2:

Solve the **compression problem** for general graphs:

Given a graph  $G$ , an integer  $k$ , and **a set  $S'$  of  $k + 1$  vertices such that  $G \setminus S'$  is bipartite**, find a set  $S$  of  $k$  vertices such that  $G \setminus S$  is bipartite.

# BIPARTITE DELETION

Solution based on iterative compression:

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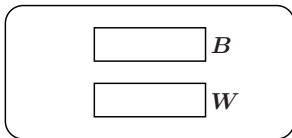
## ⑥ Step 3:

Apply the magic of iterative compression. . .



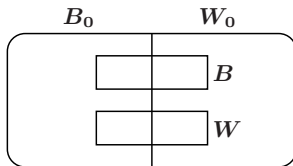
## Step 1: The annotated problem

Given a **bipartite** graph  $G$ , two sets  $B, W \subseteq V(G)$ , and an integer  $k$ , find a set  $S$  of at most  $k$  vertices such that  $G \setminus S$  has a 2-coloring where  $B \setminus S$  is black and  $W \setminus S$  is white.



## Step 1: The annotated problem

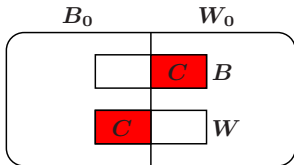
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Find an arbitrary 2-coloring  $(B_0, W_0)$  of  $G$ .

## Step 1: The annotated problem

Given a bipartite graph  $G$ , two sets  $B, W \subseteq V(G)$ , and an integer  $k$ , find a set  $S$  of at most  $k$  vertices such that  $G \setminus S$  has a 2-coloring where  $B \setminus S$  is black and  $W \setminus S$  is white.



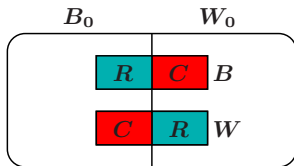
Find an arbitrary 2-coloring  $(B_0, W_0)$  of  $G$ .

$C := (B_0 \cap W) \cup (W_0 \cap B)$  should change color, while

$R := (B_0 \cap B) \cup (W_0 \cap W)$  should remain the same color.

## Step 1: The annotated problem

Given a bipartite graph  $G$ , two sets  $B, W \subseteq V(G)$ , and an integer  $k$ , find a set  $S$  of at most  $k$  vertices such that  $G \setminus S$  has a 2-coloring where  $B \setminus S$  is black and  $W \setminus S$  is white.



Find an arbitrary 2-coloring  $(B_0, W_0)$  of  $G$ .

$C := (B_0 \cap W) \cup (W_0 \cap B)$  should change color, while

$R := (B_0 \cap B) \cup (W_0 \cap W)$  should remain the same color.

**Lemma:**  $G \setminus S$  has the required 2-coloring if and only if  $S$  separates  $C$  and  $R$ , i.e., no component of  $G \setminus S$  contains vertices from both  $C \setminus S$  and  $R \setminus S$ .

## Step 1: The annotated problem

**Lemma:**  $G \setminus S$  has the required 2-coloring if and only if  $S$  separates  $C$  and  $R$ , i.e., no component of  $G \setminus S$  contains vertices from both  $C \setminus S$  and  $R \setminus S$ .

**Proof:**

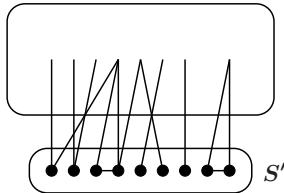
$\Rightarrow$  In a 2-coloring of  $G \setminus S$ , each vertex either remained the same color or changed color. Adjacent vertices do the same, thus every component either changed or remained.

$\Leftarrow$  Flip the coloring of those components of  $G \setminus S$  that contain vertices from  $C \setminus S$ . No vertex of  $R$  is flipped.

**Algorithm:** Using max-flow min-cut techniques, we can check if there is a set  $S$  that separates  $C$  and  $R$ . It can be done in time  $O(k|E(G)|)$  using  $k$  iterations of the Ford-Fulkerson algorithm.

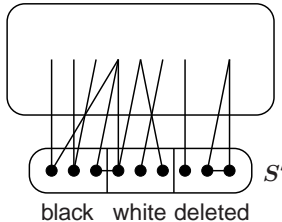
## Step 2: The compression problem

Given a graph  $G$ , an integer  $k$ , and a set  $S'$  of  $k + 1$  vertices such that  $G \setminus S'$  is bipartite, find a set  $S$  of  $k$  vertices such that  $G \setminus S$  is bipartite.



## Step 2: The compression problem

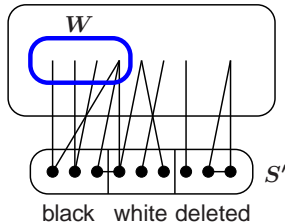
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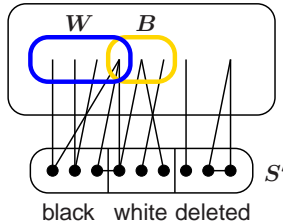
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Neighbors of the black vertices in  $S'$  should be white and the neighbors of the white vertices in  $S'$  should be black.



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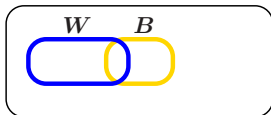
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The vertices of  $S'$  can be disregarded. Thus we need to solve the annotated problem on the bipartite graph  $G \setminus S'$ .

**Running time:**  $O(3^k \cdot k|E(G)|)$  time.

## ***Step 3: Iterative compression***



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We get it for free!

Let  $V(G) = \{v_1, \dots, v_n\}$  and let  $G_i$  be the graph induced by  $\{v_1, \dots, v_i\}$ .

For every  $i$ , we find a set  $S_i$  of size  $k$  such that  $G_i \setminus S_i$  is bipartite.

- ⑥ For  $G_k$ , the set  $S_k = \{v_1, \dots, v_k\}$  is a trivial solution.
- ⑥ If  $S_{i-1}$  is known, then  $S_{i-1} \cup \{v_i\}$  is a set of size  $k + 1$  whose deletion makes  $G_i$  bipartite  $\Rightarrow$  We can use the compression algorithm to find a suitable  $S_i$  in time  $O(3^k \cdot k|E(G_i)|)$ .

## Step 3: Iterative Compression

Bipartite-Deletion( $G, k$ )

1.  $S_k = \{v_1, \dots, v_k\}$
2. for  $i := k + 1$  to  $n$
3. Invariant:  $G_{i-1} \setminus S_{i-1}$  is bipartite.
4. Call Compression( $G_i, S_{i-1} \cup \{v_i\}$ )
5. If the answer is "NO"  $\Rightarrow$  return "NO"
6. If the answer is a set  $X \Rightarrow S_i := X$
7. Return the set  $S_n$

**Running time:** the compression algorithm is called  $n$  times and everything else can be done in linear time

$\Rightarrow O(3^k \cdot k|V(G)| \cdot |E(G)|)$  time algorithm.

## Feedback Vertex Set in Tournaments

- **Input** : A tournament  $D$  and integer  $k$ .
- **Parameter** :  $k$
- **Output** :  $S \subseteq V(D)$  such that  $D - S$  is an acyclic directed graph.

## Feedback Vertex Set in Tournaments

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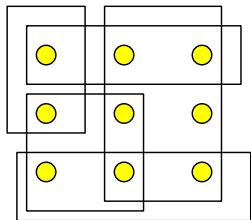
Tournament:

- A Complete Directed Graph.
- **Exercise**: There is a (directed) cycle if and only if there is a cycle of length 3.
- **Exercise**: Using iterative compression, show that FVST is FPT parameterized by the solution size  $k$ .



# Dynamic Programming

## Set Cover



- **Input** : A universe  $U$  of  $n$  elements and a family  $\mathcal{F} = \{F_1, F_2, \dots, F_m\}$  of  $m$  subsets of  $U$ .
- **Parameter** :  $n$  (Size of the Universe)
- **Output** : A subfamily  $\mathcal{F}' \subseteq \mathcal{F}$  of minimum size that “covers  $U$ ”

$$\bigcup_{F \in \mathcal{F}'} F = U$$

### Theorem

SET COVER is FPT parameterized by the size of the universe

Running time:  $2^n \cdot \text{poly}(n, m)$

# Set Cover: Dynamic Programming

- Fix an ordering of the family  $\mathcal{F}: F_1, F_2, \dots, F_m$
- Dynamic Programming Table,

for every  $X \subseteq U$  and  $j \in \{0, 1, \dots, m\}$

$T[X, j] =$  size of a min subset of  $\{F_1, F_2, \dots, F_j\}$  that covers  $X$

- Table Size:  $2^{|U|} \times m$
- **Base Case** :  $T[X, 0] = 0$  if  $X = \emptyset$ , else it is  $\infty$ .
- **Recursion Step** :

$$T[X, j] = \min \{ T[X, j-1], 1 + T[X \setminus F_j, j-1] \}$$

- Either  $X$  can be covered using within  $\{F_1, F_2, \dots, F_{j-1}\}$
- Or we need  $F_j$  + best solution of  $X \setminus F_j$
- $T[U, m]$  is the minimum set cover size
- Maintain a candidate solution along with each  $T[X, j]$ .

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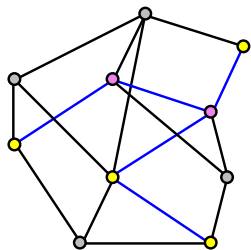
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**Exercise:** Prove that  $T[X, j]$  indeed contains a minimum set cover of  $X$  from  $\{F_1, F_2, \dots, F_j\}$

# Steiner Tree



- **Input** : Graph  $G$  on  $n$  vertices,  $S \subseteq V(G)$  of  $k$  vertices called **Terminals**.
- **Parameter** :  $k$  (Number of Terminals)
- **Output** : Minimum connected subgraph  $H$  of  $G$  that contains all of  $S$ .

Observation :  $H$  must be a **Tree**

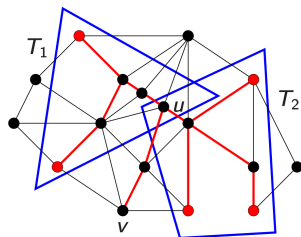
## Theorem

STEINER TREE can be solved in time  $3^k \cdot \text{poly}(n)$ .

Notation:

- $d_G(u, v)$  = length of shortest path between  $u$  and  $v$  in  $G$ .
- Assume every terminal  $s \in S$  has degree 1

# Steiner Tree: Dynamic Programming



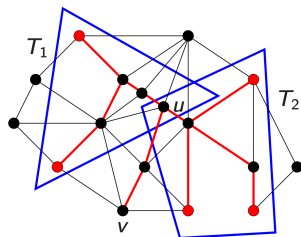
- DP Table: For  $X \subseteq S$  and  $v \in V(G)$

$T[X, v]$  = minimum cost of a sub-tree containing  $X \cup v$ .

- Table Size:  $2^S \cdot n$
- Base Case I:  $T[\emptyset, v] = 1$  for every  $v \in V(G)$
- Base Case II:  $T[\{s\}, v] = d_G(s, v)$  for every  $s \in S$
- Recursive Case: for  $X \subseteq V(G)$ ,  $|X| \geq 2$

$$T[X, v] = \min_{u \in V(G), \emptyset \neq Y \subsetneq X} d_G(u, v) + T[Y, u] + T[X \setminus Y, u]$$

# Steiner Tree: Dynamic Programming



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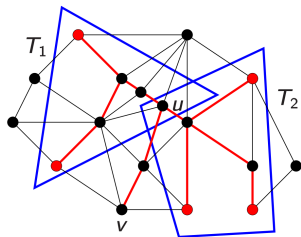
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$$T[X, v] = \min_{u \in V(G), \emptyset \neq Y \subsetneq X} d_G(u, v) + T[Y, u] + T[X \setminus Y, u]$$

**Correctness:** (LHS  $\leq$  RHS)

- For any  $Y \subseteq X$  and  $u \in V(G)$ , the RHS is the cost of a sub-tree connecting  $X \cup v$ .
- RHS = min-cost subtree for  $Y \cup u$  + min-cost subtree for  $(X \setminus Y) \cup u$  + shortest path between  $u$  and  $v$

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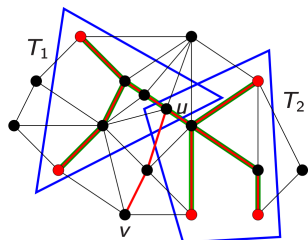
- Consider a minimum subtree  $H$  of  $G$  connecting  $X \cup v$ .
- root  $H$  at  $v$ , and  $u$  is the closest descendant with multiple children  $\{u_1, u_2, \dots, u_\ell\}$

Note:  $u$  exists because  $|X| \geq 2$  and all terminals have degree 1.

Further  $d_H(u, v) = d_G(u, v)$ , by choice of  $H$



# Steiner Tree: Dynamic Programming



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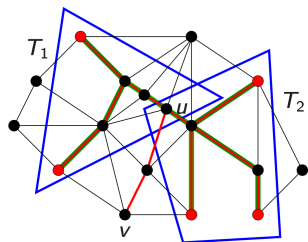
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**Correctness:** (LHS  $\geq$  RHS)

- Let  $Y$  = all terminal from  $X$  in sub-tree of  $u_1$ .
- Split  $H$  into 3 parts
  - The sub-path between  $u$  and  $v$
  - The sub-tree of  $H$  rooted at  $u_1$  + edge  $(u, u_1)$
  - The sub-tree of  $H$  excluding the above

# Steiner Tree: Dynamic Programming



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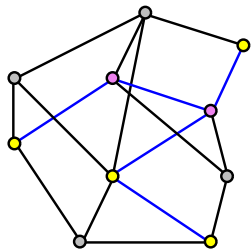
## Running Time:

- Computing  $T[X, v]$  requires  $2^{|X|} \cdot \text{poly}(n)$  time.
- Computing the entire table requires time:

$$\sum_{v \in V(G), X \subseteq S} 2^{|X|} \cdot \text{poly}(n)$$

- This is  $3^{|S|} \cdot \text{poly}(n)$

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Exercise: STEINER TREE with **weights** (Positive Integers)

# Thank You.

Iterative Compression slides,  
courtesy Neeldhara Misra and Daniel Marx.