

# Graduate Algorithms

*CS673-2016F-16*

*Spanning Trees*

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# 16-0: Spanning Trees

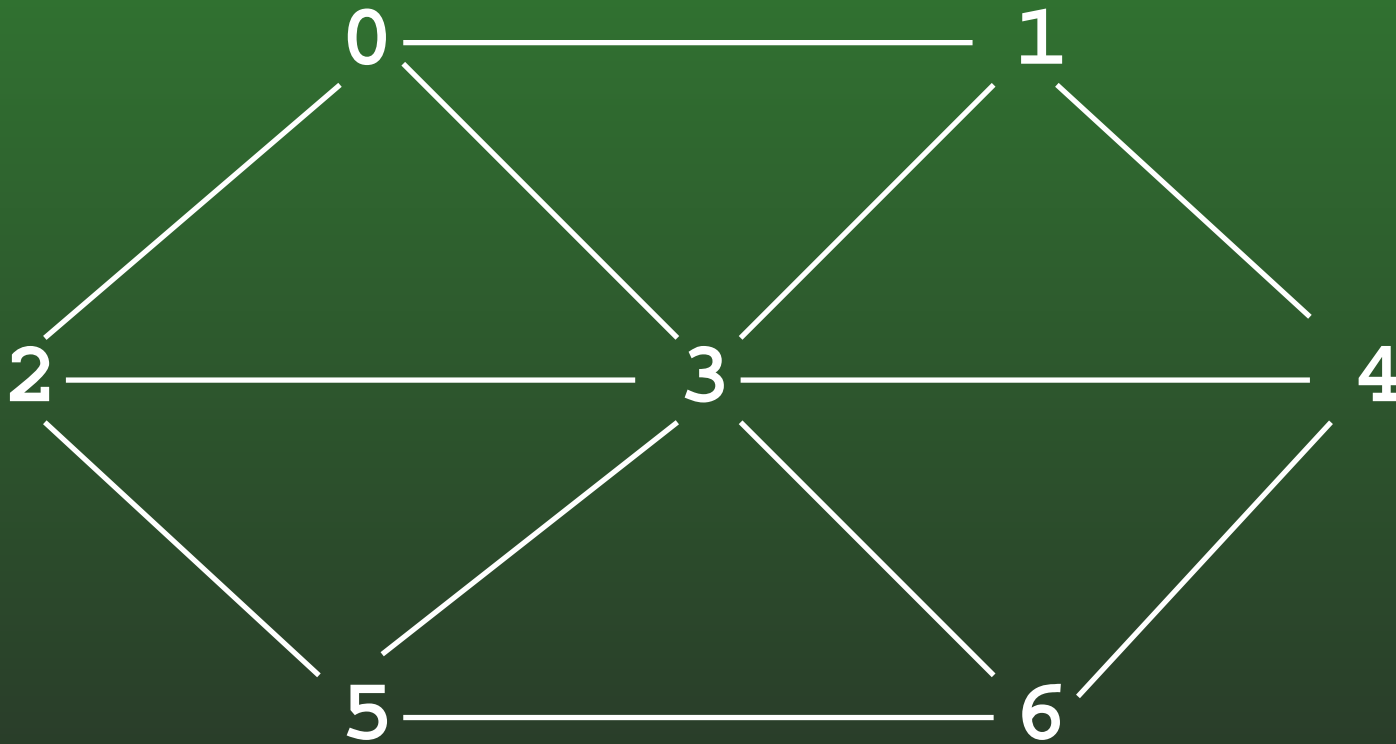
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- Given a connected, undirected graph  $G$ 
  - A *subgraph* of  $G$  contains a subset of the vertices and edges in  $G$
  - A *Spanning Tree*  $T$  of  $G$  is:
    - subgraph of  $G$
    - contains all vertices in  $G$
    - connected
    - acyclic

# 16-1: Spanning Tree Examples

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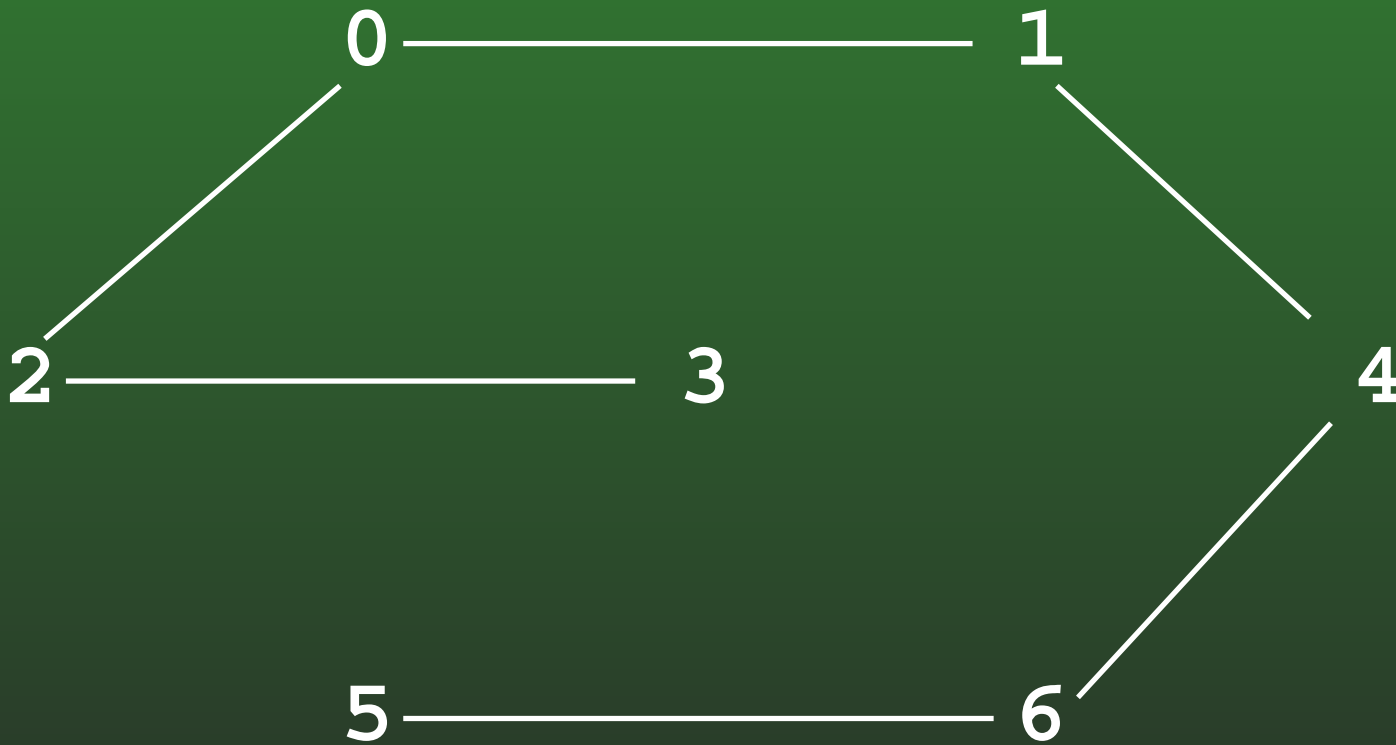
- Graph



# 16-2: Spanning Tree Examples

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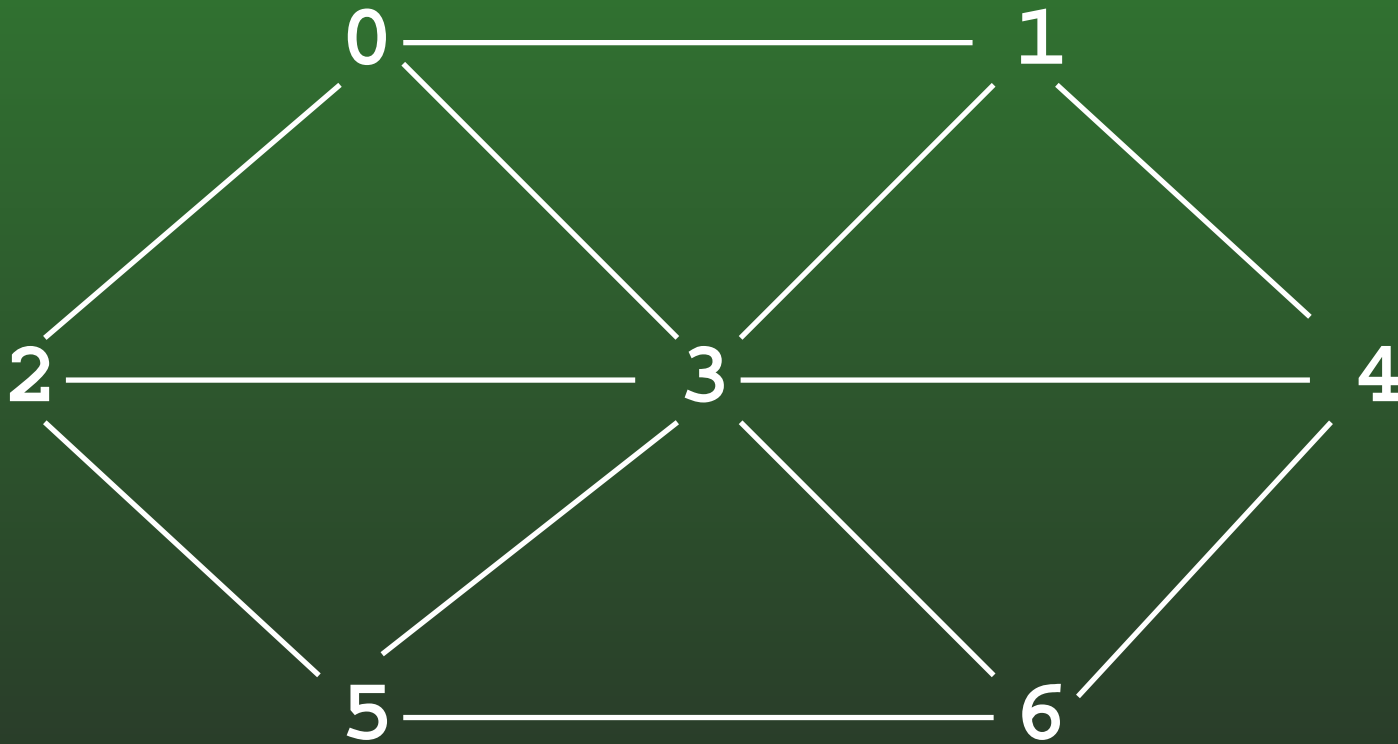
- Spanning Tree



# 16-3: Spanning Tree Examples

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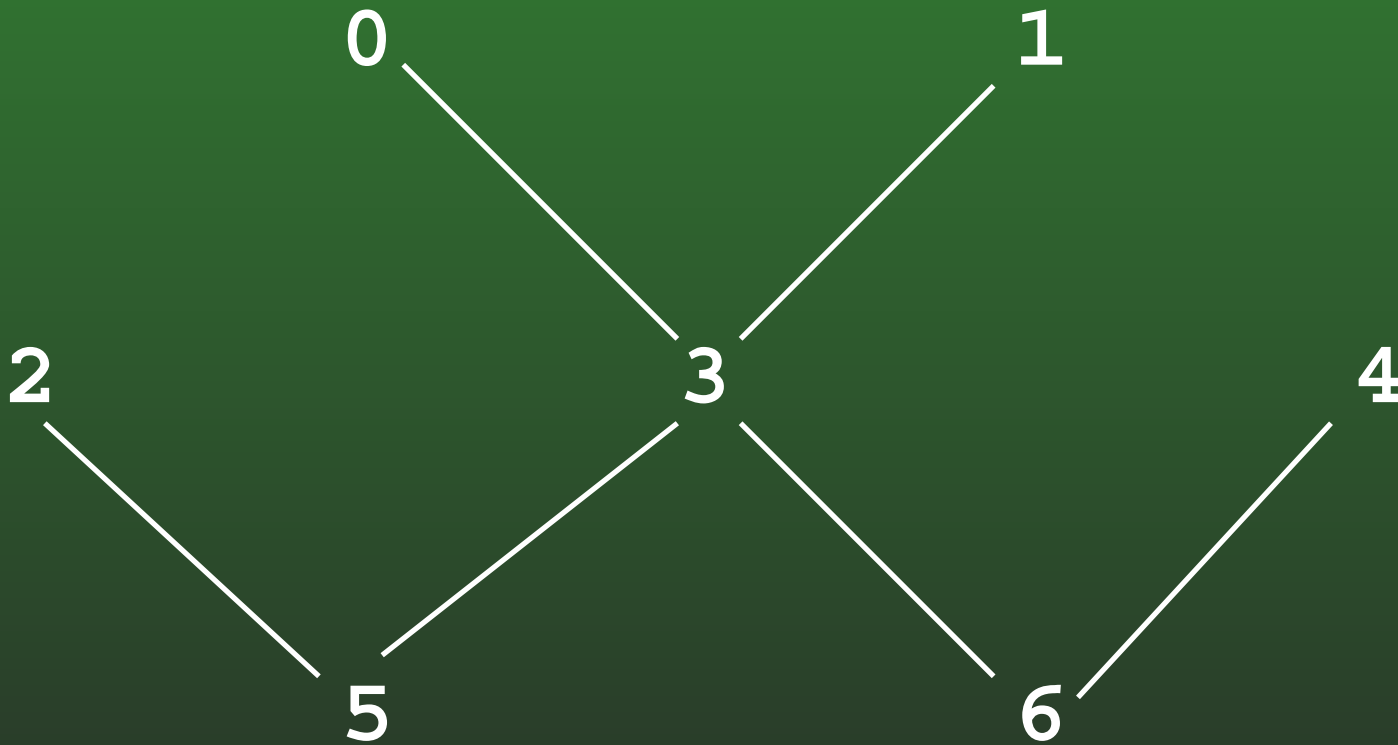
- Graph



# 16-4: Spanning Tree Examples

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- Spanning Tree



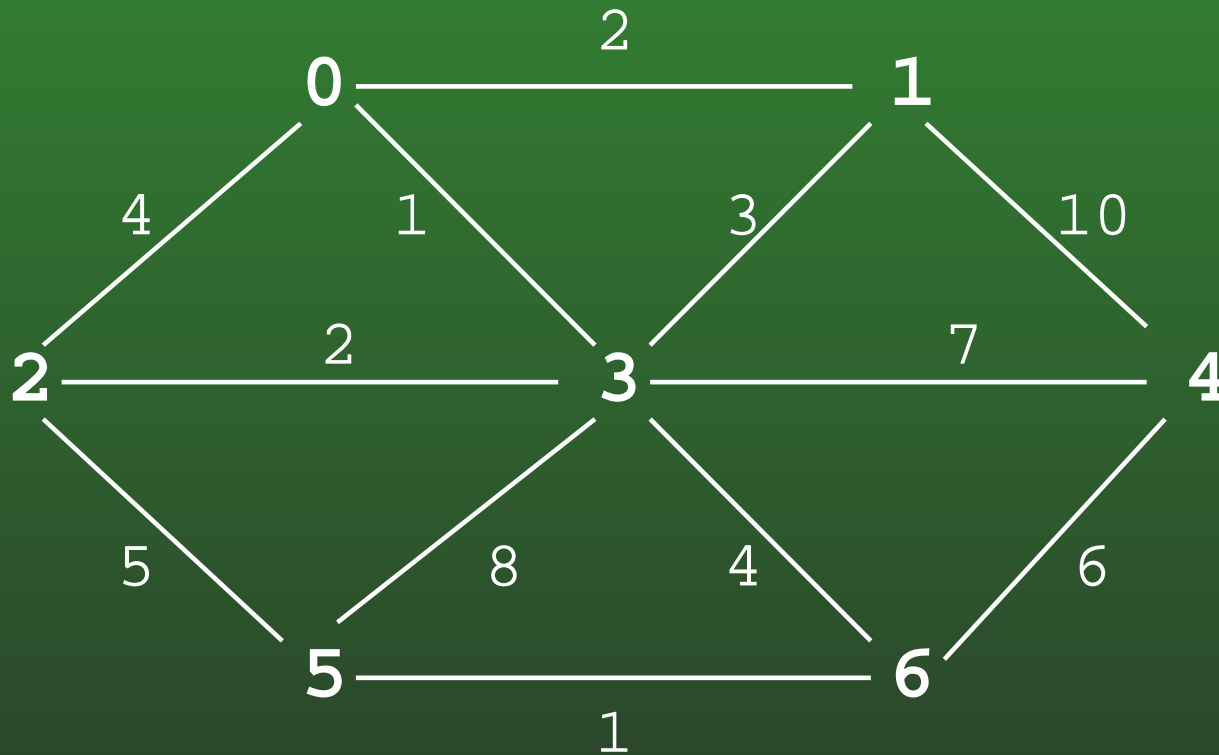
## 16-5: Minimal Cost Spanning Tree

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- Minimal Cost Spanning Tree
  - Given a weighted, undirected graph  $G$
  - Spanning tree of  $G$  which minimizes the sum of all weights on edges of spanning tree

## 16-6: MST Example

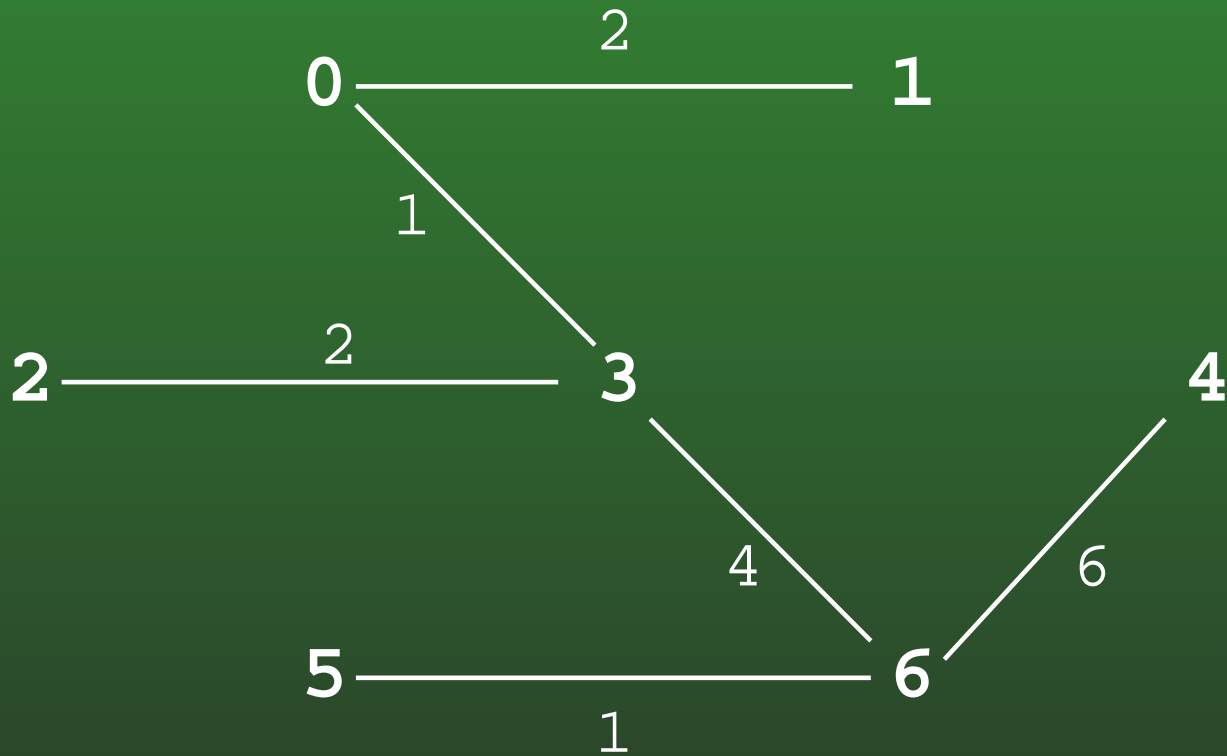
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## 16-7: MST Example

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# 16-8: Minimal Cost Spanning Trees

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- Can there be more than one minimal cost spanning tree for a particular graph?

## 16-9: Minimal Cost Spanning Trees

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- Can there be more than one minimal cost spanning tree for a particular graph?
- YES!
  - What happens when all edges have unit cost?

# 16-10: Minimal Cost Spanning Trees

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- Can there be more than one minimal cost spanning tree for a particular graph?
- YES!
  - What happens when all edges have unit cost?
  - All spanning trees are MSTs

# 16-11: Calculating MST

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- Generic MST algorithm:

$A \leftarrow \{\}$   
while  $A$  does not form a spanning tree  
  find an edge  $(u, v)$  that is safe for  $A$   
   $A \leftarrow A \cup \{(u, v)\}$

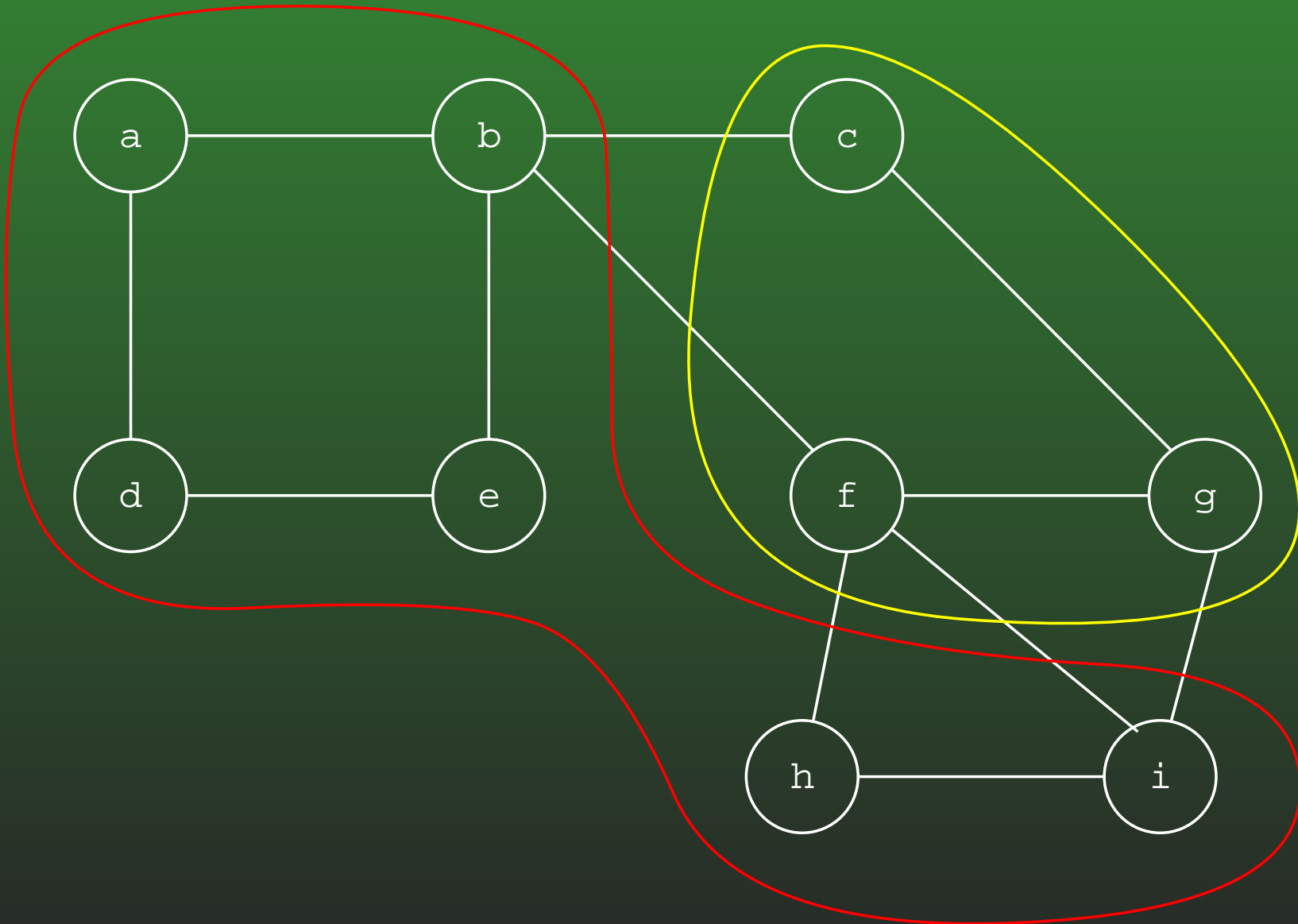
- $(u, v)$  is safe to for  $A$  when  $A \cup \{(u, v)\}$  is a subset of some MST

## 16-12: Graph Cut

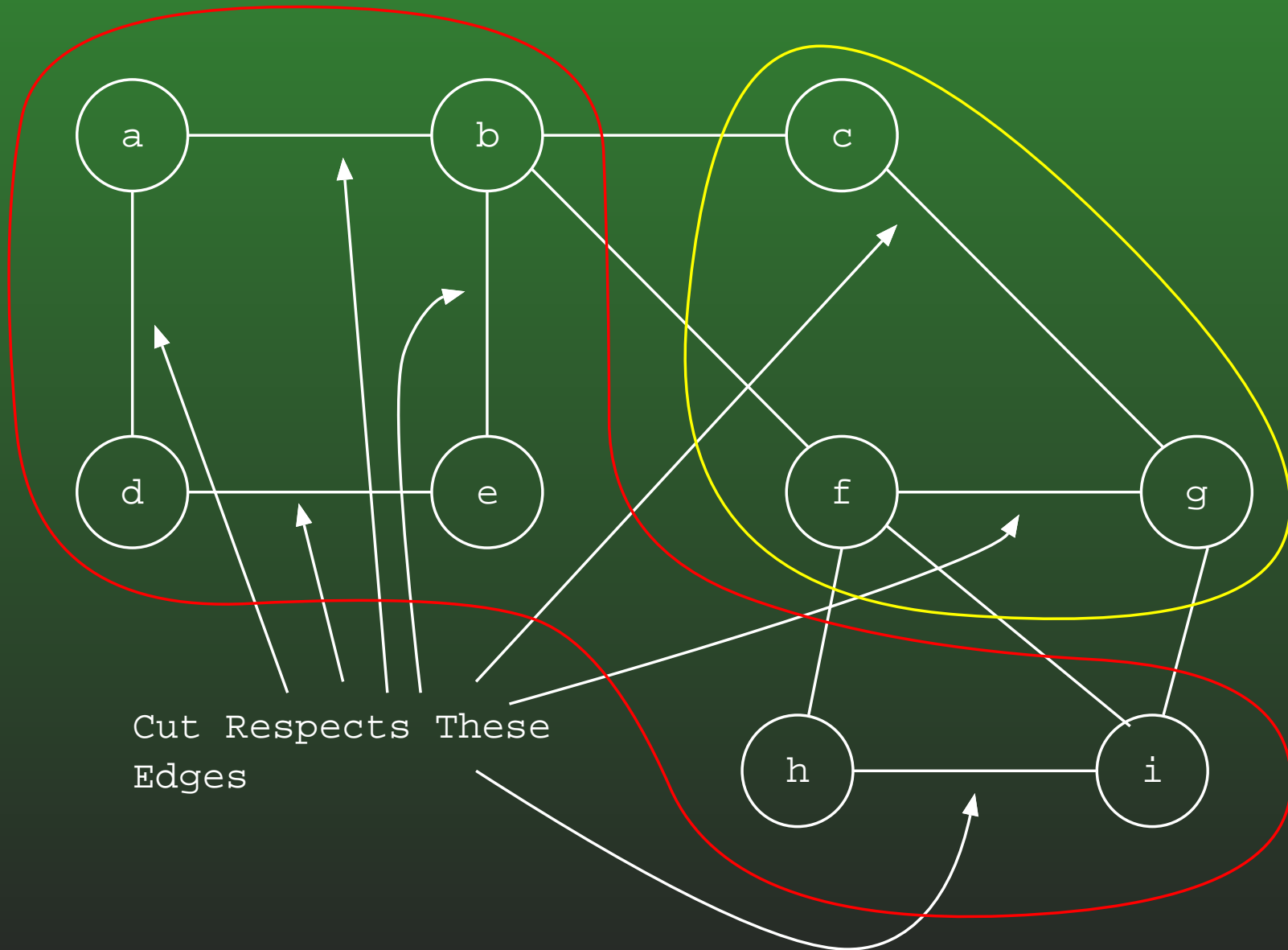
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- “Cut” of a undirected graph is a partition of the vertices in the graph
  - An edge crosses a cut if the vertices are in different sets of the partition
  - A cut respects a series of edges if no edge crosses the cut
  - light edge is an edge that crosses the cut that has minimum cost

# 16-13: Graph Cut

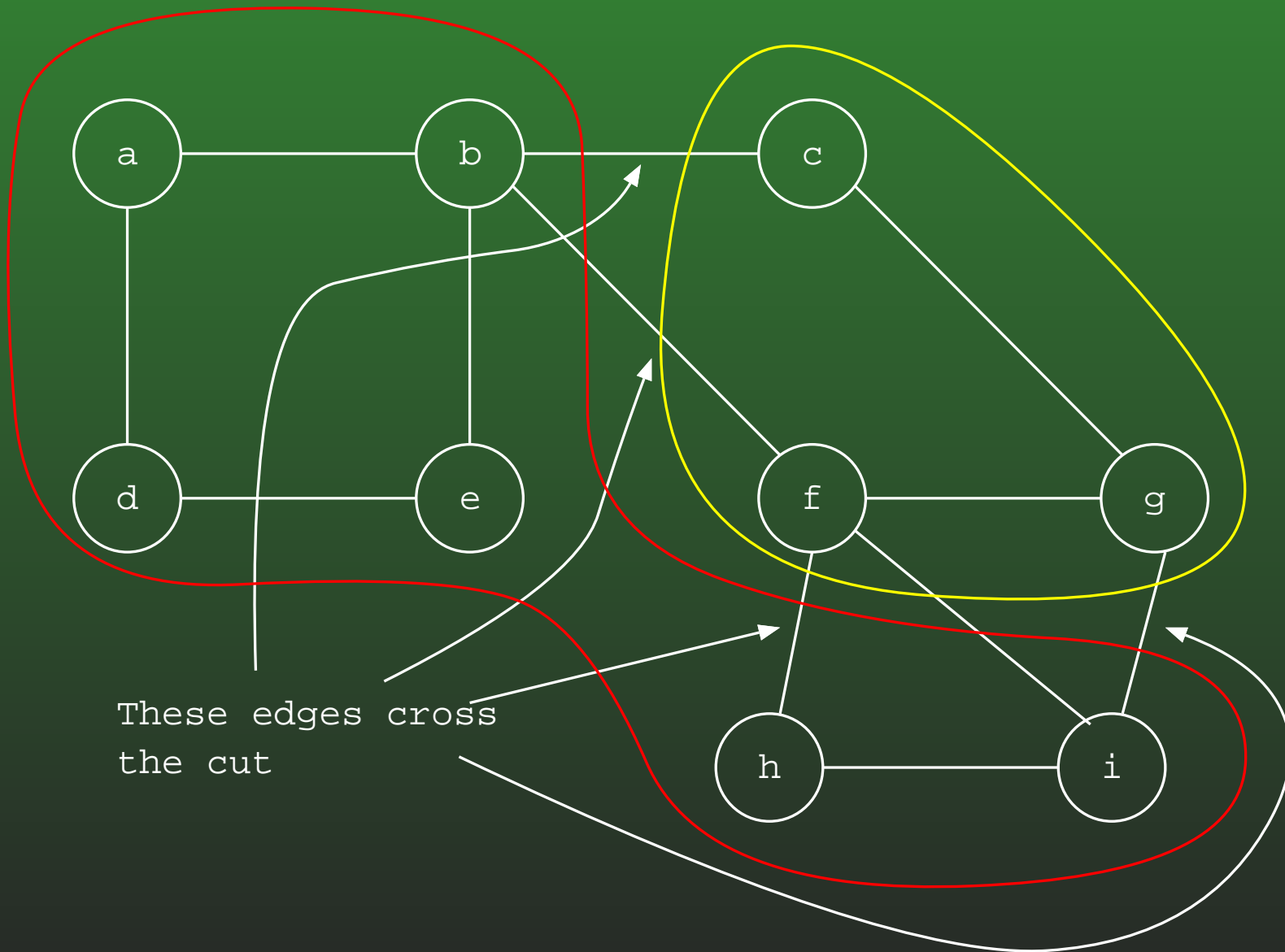


# 16-14: Graph Cut

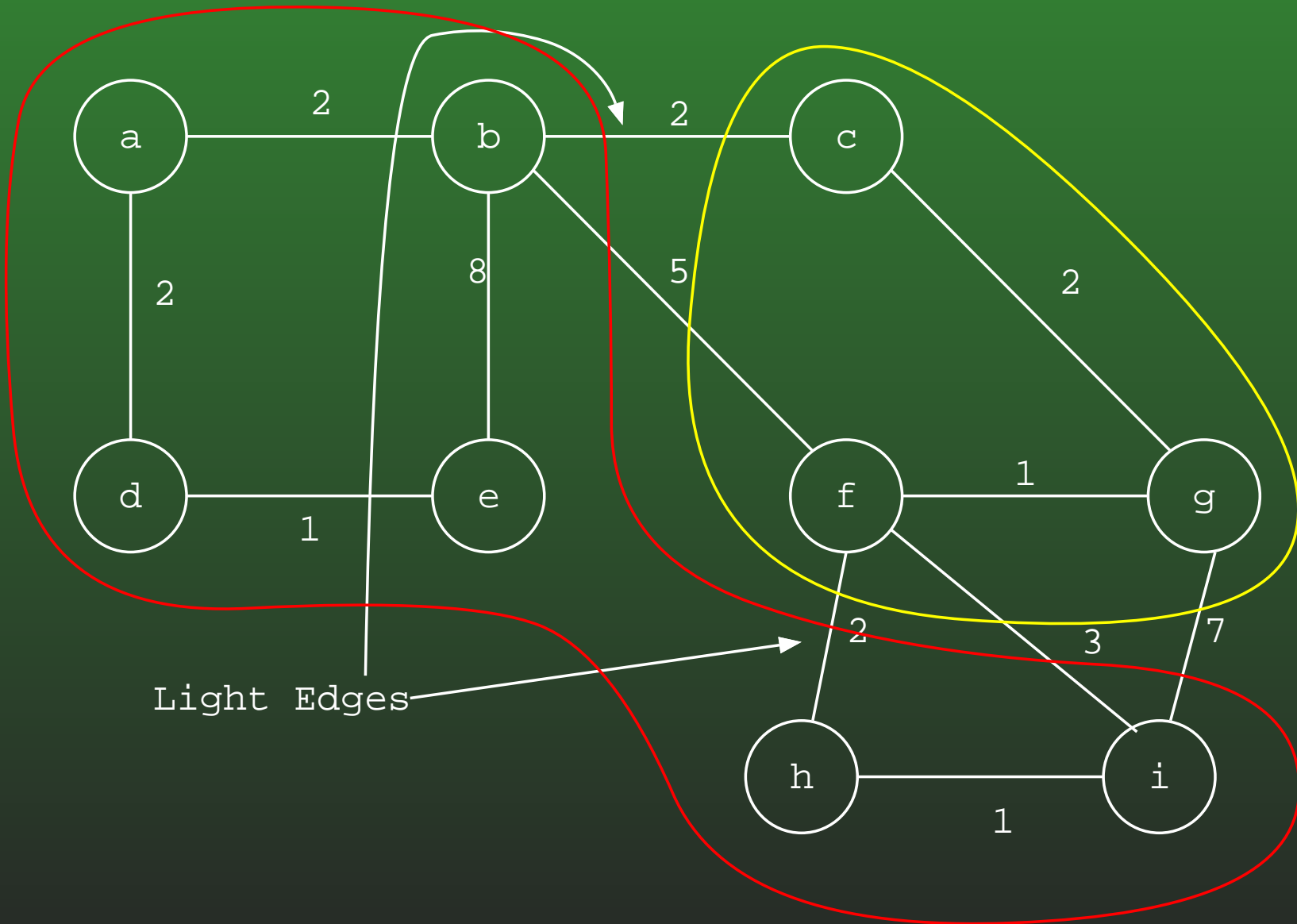




# 16-15: Graph Cut



# 16-16: Graph Cut



## 16-17: Safe Edges

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- $A$  is a set of edges, which is a subset of some MST
- Cut  $\{S, V - S\}$  which respects  $A$
- Any light edge (with respect to the cut  $\{S, V - S\}$ ) is safe
  - That is,  $A \cup \{(u, v)\}$  is a subset of some MST if  $\{(u, v)\}$  is a light edge in a cut that respects  $A$

## 16-18: Safe Edges

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- Proof by contradiction:
  - Assume there is:
    - a subset of a MST  $A$
    - a Cut  $\{S, V - S\}$  that respects  $A$
    - a light edge  $(u, v)$
  - such that  $A \cup \{(u, v)\}$  is not a subset of any MST
- We will show that this leads to a contradiction

## 16-19: Safe Edges

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- Let  $A'$  be a MST that is a superset of  $A$
- Add  $(u, v)$  to  $A'$  to get  $A''$  – now have a cycle
- This cycle must cross the cut at least twice
  - $(u, v)$  is one crossing
  - Must be another crossing  $(u', v')$  back across the cut
- remove  $(u', v')$  from  $A''$  to get  $A'''$
- $A'''$  is a spanning tree
- $\text{cost}(A''') = \text{cost}(A') - \text{cost}((u', v')) + \text{cost}((u, v))$
- $\text{cost}((u, v)) \leq \text{cost}((u', v')) \Rightarrow \text{cost}(A''') \leq \text{cost}(A')$

## 16-20: Safe Edges

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- Let  $A'$  be a MST that is a superset of  $A$
- Add  $(u, v)$  to  $A'$  to get  $A''$  – now have a cycle
- This cycle must cross the cut at least twice
- Must be another crossing  $(u', v')$  back across the cut
- remove  $(u', v')$  from  $A''$  to get  $A'''$
- $A'''$  is a spanning tree
- $\text{cost}(A''') = \text{cost}(A') - \text{cost}((u', v')) + \text{cost}((u, v))$
- $\text{cost}((u, v)) \leq \text{cost}((u', v')) \Rightarrow \text{cost}(A''') \leq \text{cost}(A')$
- Thus  $A'''$  must be a MST that contains  $A$  and  $\{(u, v)\}$ , a contradiction

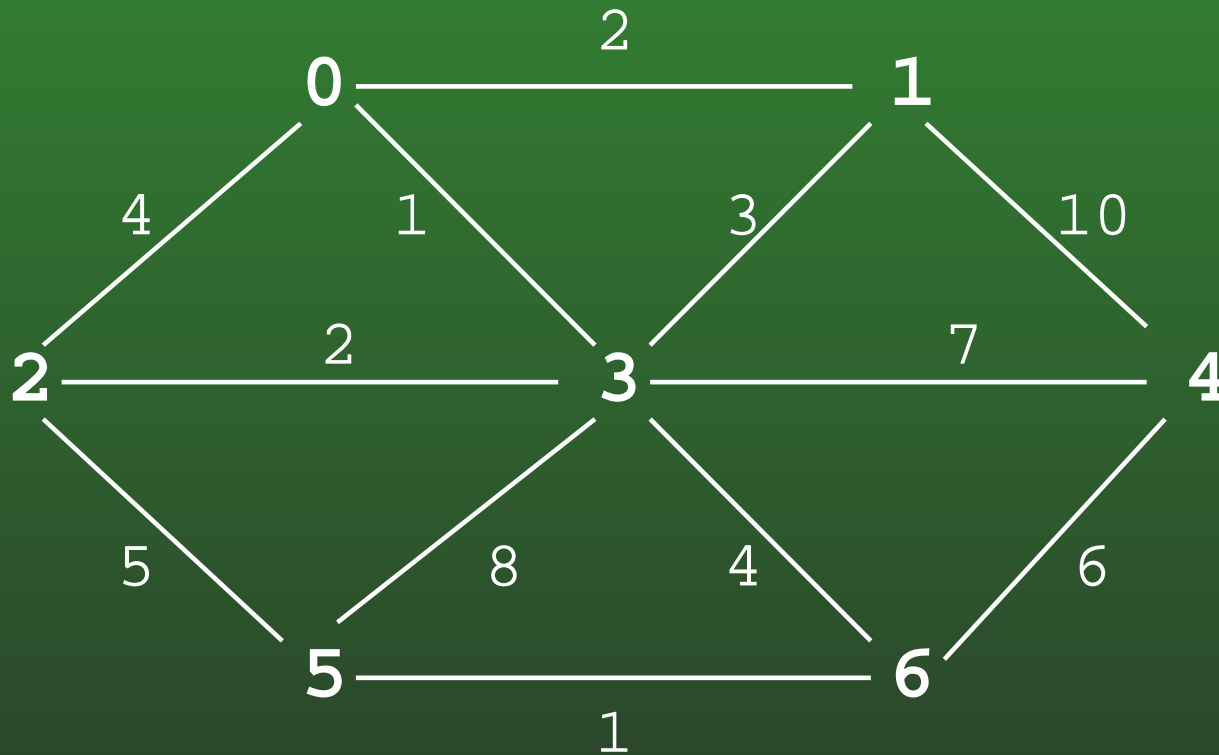
# 16-21: Kruskal's Algorithm

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- Start with an empty graph (no edges)
- Sort the edges by cost
- For each edge  $e$  (in increasing order of cost)
  - Add  $e$  to  $G$  if it would not cause a cycle

# 16-22: Kruskal's Algorithm Examples

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# 16-23: Kruskal's Algorithm

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- Correctness proof:
  - Kruskal's algorithm always selects a light edge, with according to some cut that respects all edges added so far.
    - Let  $(u, v)$  be the cheapest edge that does not cause a cycle
    - Let  $S$  be the connected component that contains  $u$ .
    - $\{S, V - S\}$  respects edges chosen so far
    - $(u, v)$  crosses the cut, and is the edge with the smallest cost that crosses the cut  $\Rightarrow (u, v)$  is a light edge
  - Thus, Kruskal's algorithm always selects a safe edge, and produces a MST

# 16-24: Kruskal's Algorithm

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- Coding Kruskal's Algorithm:
  - Place all edges into a list
  - Sort list of edges by cost
  - For each edge in the list
    - Select the edge if it does not form a cycle with previously selected edges
    - How can we do this?

# 16-25: Kruskal's Algorithm

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- Determining if adding an edge will cause a cycle
  - Start with a forest of  $V$  trees (each containing one node)
  - Each added edge merges two trees into one tree
  - An edge causes a cycle if both vertices are in the same tree
    - (examples)

# 16-26: Kruskal's Algorithm

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- We need to:
  - Put each vertex in its own tree
  - Given any two vertices  $v_1$  and  $v_2$ , determine if they are in the same tree
  - Given any two vertices  $v_1$  and  $v_2$ , merge the tree containing  $v_1$  and the tree containing  $v_2$
- ... sound familiar?

# 16-27: Kruskal's Algorithm

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- Disjoint sets!
- Create a list of all edges
- Sort list of edges
- For each edge  $e = (v_1, v_2)$  in the list
  - if  $\text{FIND}(v_1) \neq \text{FIND}(v_2)$ 
    - Add  $e$  to spanning tree
    - $\text{UNION}(v_1, v_2)$

# 16-28: Kruskal's Algorithm

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- Running time?

# 16-29: Kruskal's Algorithm

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- Running time?
  - Sort edges:  $\Theta(|E| \lg |E|)$
  - Build tree:  $O(E)$
- Total:  $\Theta(|E| \lg |E|)$

## 16-30: Prim's Algorithm

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- Grow that spanning tree out from an initial vertex
- Divide the graph into two sets of vertices
  - vertices in the spanning tree
  - vertices *not* in the spanning tree
- Initially, Start vertex is in the spanning tree, all other vertices are not in the tree
  - Pick the initial vertex arbitrarily



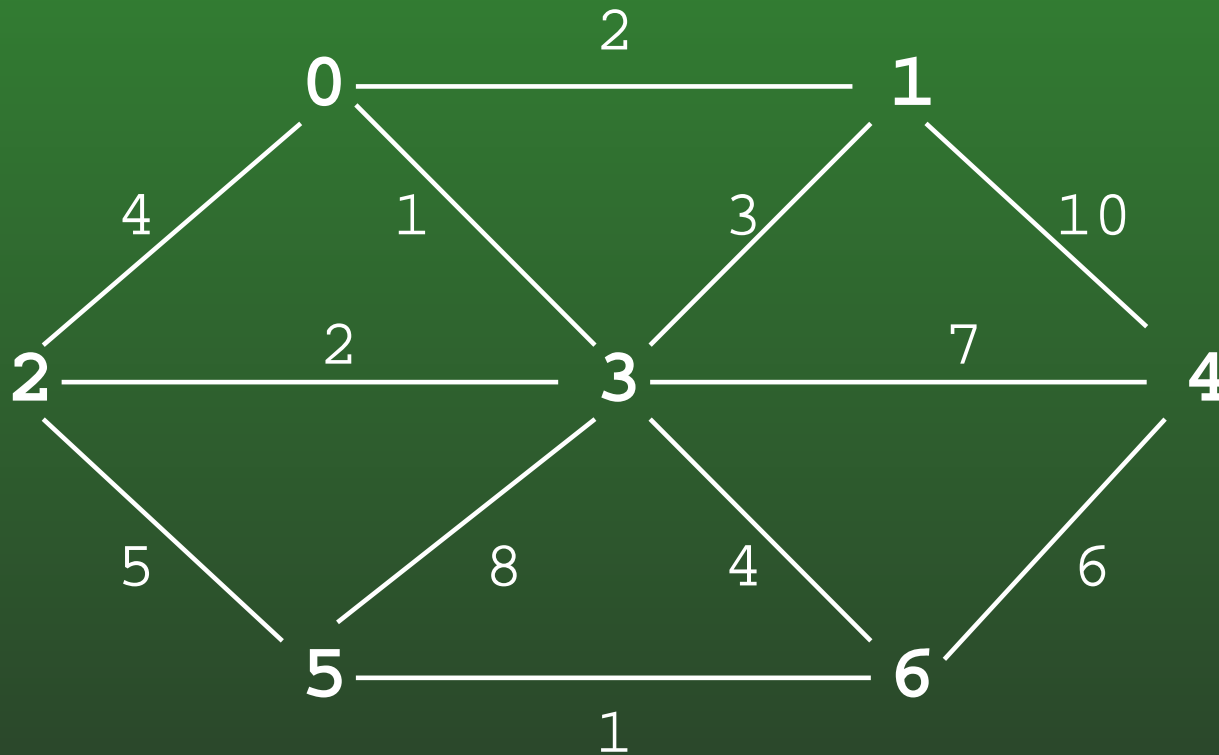
# 16-31: Prim's Algorithm

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- While there are vertices not in the spanning tree
  - Add the cheapest vertex to the spanning tree

# 16-32: Prim's Algorithm Examples

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## 16-33: Prim's Algorithm

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- Maintain a table, which keeps track of:
  - Whether or not the vertex has been added to the MST (Known)
  - Current cheapest cost to add the vertex to the MST (Cost)
  - Neighbor to connect to, to get the cheapest cost (Path)

# 16-34: Prim Code

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```
void Prim(Edge G[], int s, tableEntry T[]) {
    int i, v;
    Edge e;
    for(i=0; i<G.length; i++) {
        T[i].distance = Integer.MAX_VALUE;
        T[i].path = -1;
        T[i].known = false;
    }
    T[s].distance = 0;
    for (i=0; i < G.length; i++) {
        v = minUnknownVertex(T);
        T[v].known = true;
        for (e = G[v]; e != null; e = e.next) {
            if (T[e.neighbor].distance > e.cost) {
                T[e.neighbor].distance = e.cost;
                T[e.neighbor].path = v;
            }
        }
    }
}
```

## 16-35: Prim Running Time

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- If  $\text{minUnknownVertex}(T)$  is calculated by doing a linear search through the table:
  - Each  $\text{minUnknownVertex}$  call takes time  $\Theta(|V|)$ 
    - Called  $|V|$  times – total time for all calls to  $\text{minUnknownVertex}$ :  $\Theta(|V|^2)$
  - If statement is executed  $|E|$  times, each time takes time  $O(1)$
  - Total time:  $O(|V|^2 + |E|) = O(|V|^2)$ .

## 16-36: Prim Running Time

- If  $\text{minUnknownVertex}(T)$  is calculated by inserting all vertices into a min-heap (using distances as key) updating the heap as the distances are changed
  - Each  $\text{minUnknownVertex}$  call takes time  $\Theta(\lg |V|)$ 
    - Called  $|V|$  times – total time for all calls to  $\text{minUnknownVertex}$ :  $\Theta(|V| \lg |V|)$
  - If statement is executed  $|E|$  times – each time takes time  $O(\lg |V|)$ , since we need to update (decrement) keys in heap
  - Total time:  
 $O(|V| \lg |V| + |E| \lg |V|) \in O(|E| \lg |V|)$
- Is this better or worse than the previous method?

## 16-37: Prim Running Time

- If  $\text{minUnknownVertex}(T)$  is calculated by inserting all vertices into a Fibonacci heap (using distances as key) updating the heap as the distances are changed
  - Each  $\text{minUnknownVertex}$  call takes amortized time  $\Theta(\lg |V|)$ 
    - Called  $|V|$  times – total amortized time for all calls to  $\text{minUnknownVertex}$ :  $\Theta(|V| \lg |V|)$
  - If statement is executed  $|E|$  times – each time takes amortized time  $O(1)$ , since decrementing keys takes time  $O(1)$ .
  - Total time:  $O(|V| \lg |V| + |E|)$
- Is this better or worse than the previous methods?

Explain

## 16-38: Prim Correctness

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- Every time we select a vertex as known, pick an edge to add to MST
- If the set of known vertices are  $K$ :
  - Create a partition  $\{K, V - K\}$
  - Next vertex that we select will be connected to the known vertices by the cheapest possible edge
  - Thus, we're always picking a light edge, according to some partition that respects all edges we've previously chosen