

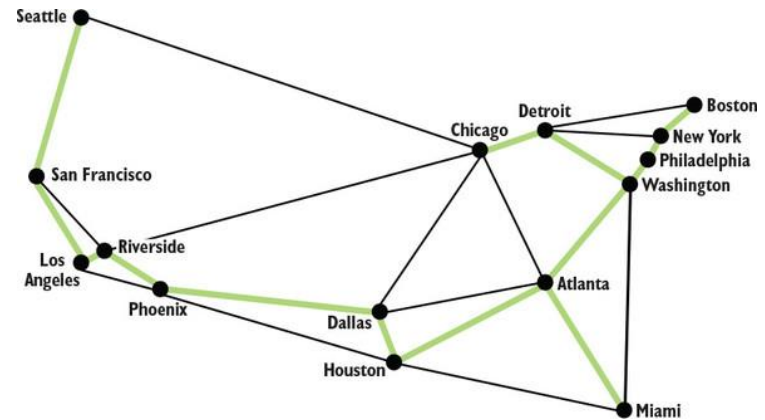
# Minimum Spanning Trees

Lecture 05.03

*by Marina Barsky*

# Motivation

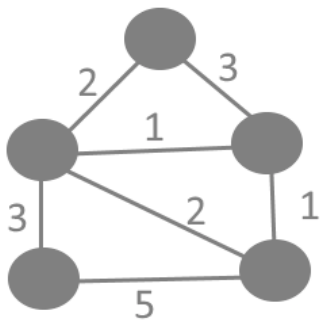
- Connect all the computers in a new office building using the least amount of cable
- Road repair: repair min-cost roads such that all the cities are still connected



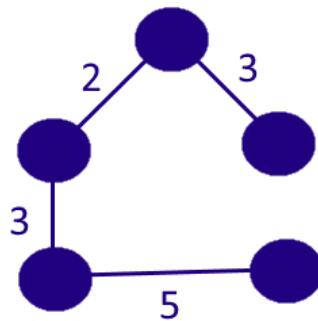
- Airline: downsize operations but preserve connectivity

# Definition

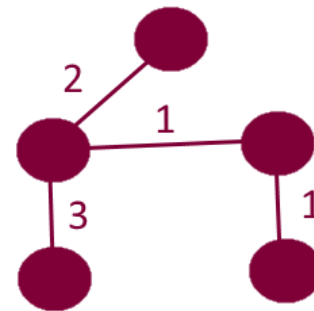
- A **Spanning Tree** of a graph  $G$ , is a subgraph of  $G$  which is a tree and contains all vertices of  $G$
- A **Minimum Spanning Tree (MST)** of a weighted graph  $G$  is a spanning tree with the smallest weight



Graph



Spanning Tree  
Cost = 13



Minimum Spanning  
Tree, Cost = 7

# Problem: compute MST of Graph G

**Input:** undirected graph  $G=(V, E)$  and the weight  $w_e$  for each edge

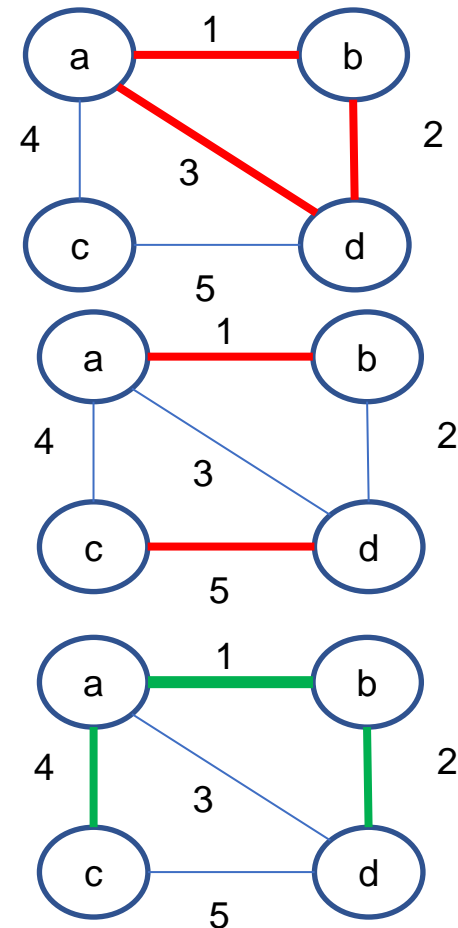
**Output:** minimum-cost tree  $T \in E$  that spans all the vertices  $V$

*Assumptions:*

*Input graph G is connected*

*Tree means:*

- $T$  has no cycles
- $T$  has exactly  $n-1$  edges
- $T$  is connected (for any two nodes  $u, v$ ,  $\exists$  path  $u \rightsquigarrow v$  (and  $v \rightsquigarrow u$ , undirected graph))

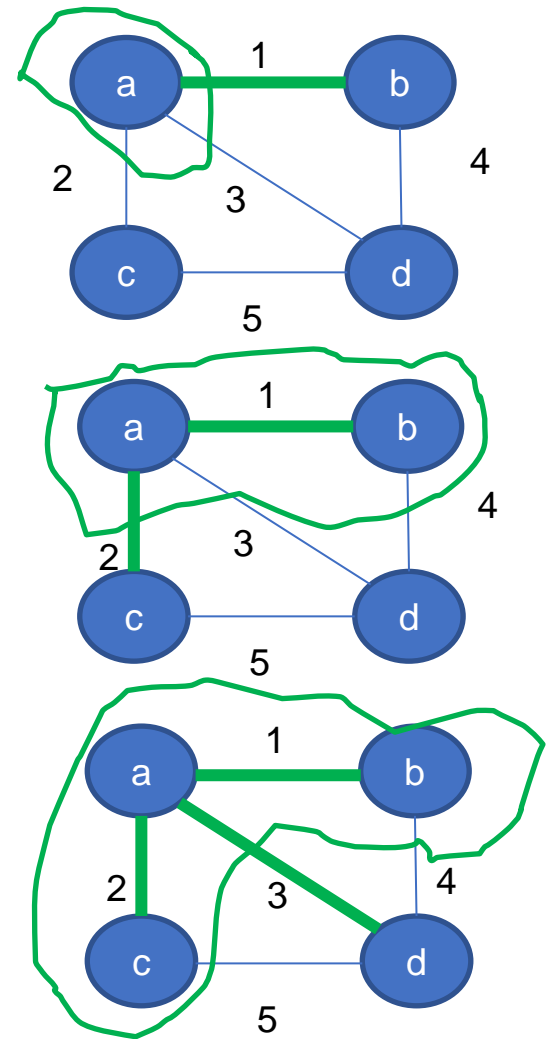


# Algorithm by Prim (and Jarnik)

Works similar to Dijkstra Shortest Path algorithm

Grows a tree from a single vertex

- Start from an arbitrary vertex
- Span another vertex by choosing **the edge with the min cost**
- Now have a tree of 2 vertices
- Check all edges out of this tree and choose the one with min-cost ...

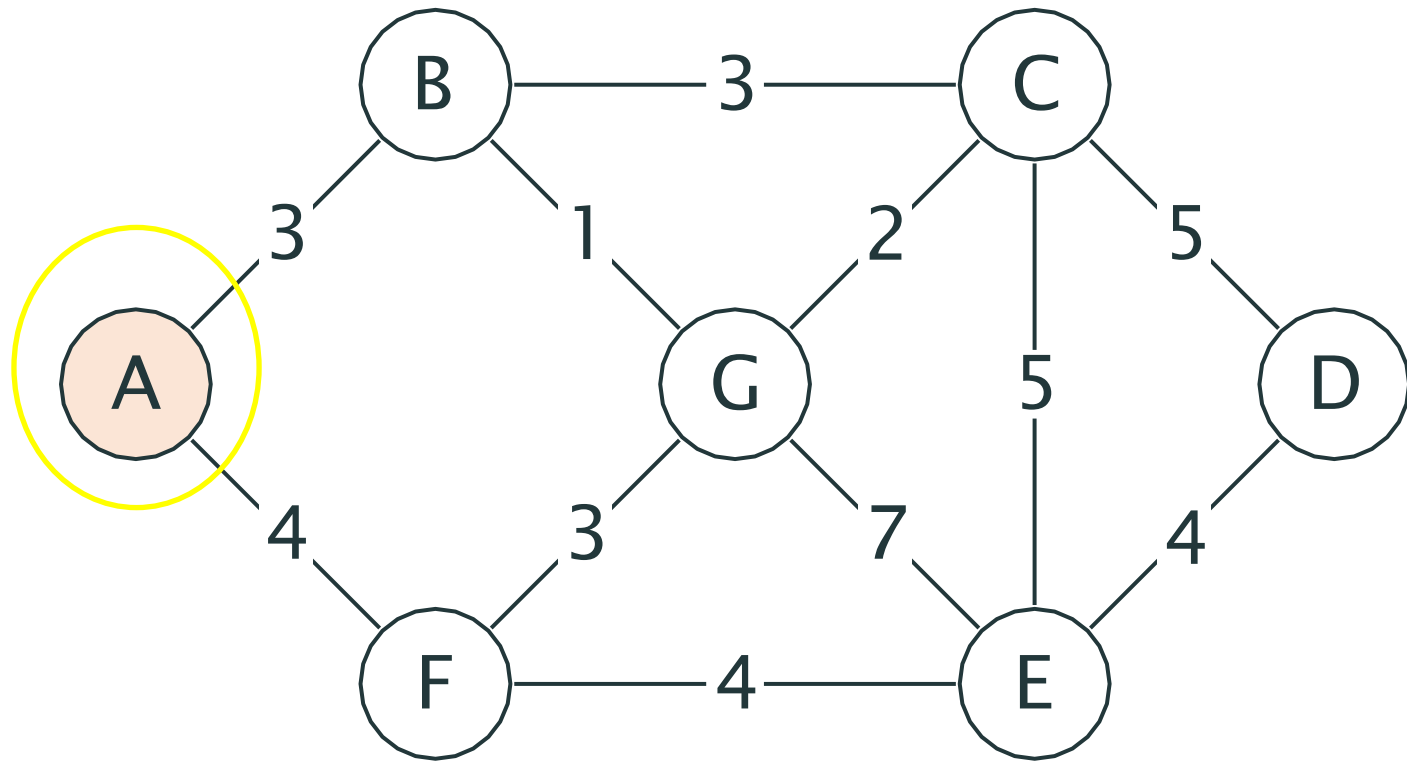


# Algorithm Prim\_MST (graph $G(V,E)$ )

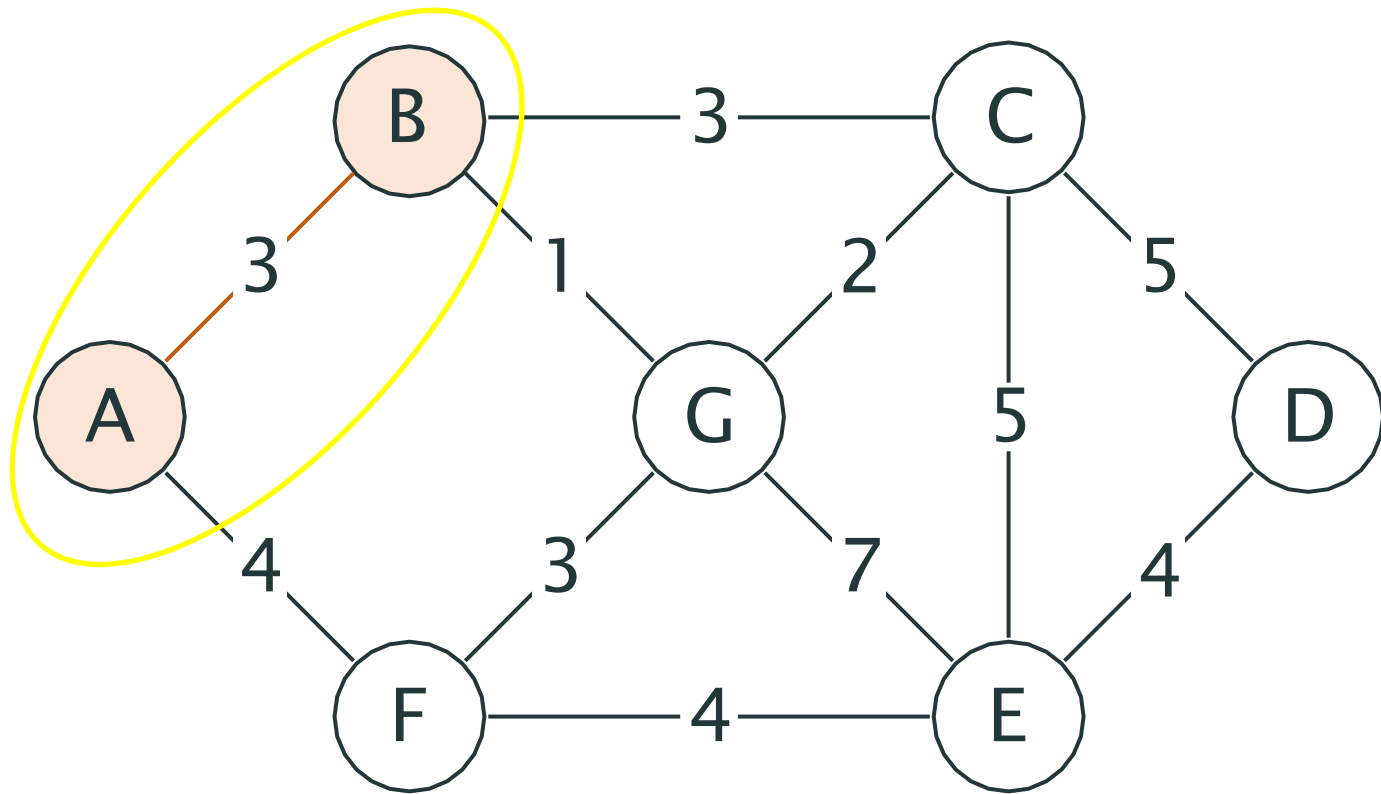
initialize tree  $T := \emptyset$                    # set of tree edges  
 $X := \{\text{vertex } s\}$                    #  $s \in V$ , chosen arbitrarily  
#  $X$  contains vertices spanned by the tree-so-far

while  $|X| \neq |V|$ :  
    let  $e=(u,v)$  the cheapest edge of  $G$  with  $u \in X$  and  $v \notin X$   
    add  $e$  to  $T$   
    add  $v$  to  $X$   
    # that increases the number of spanned vertices

# Prim: illustration

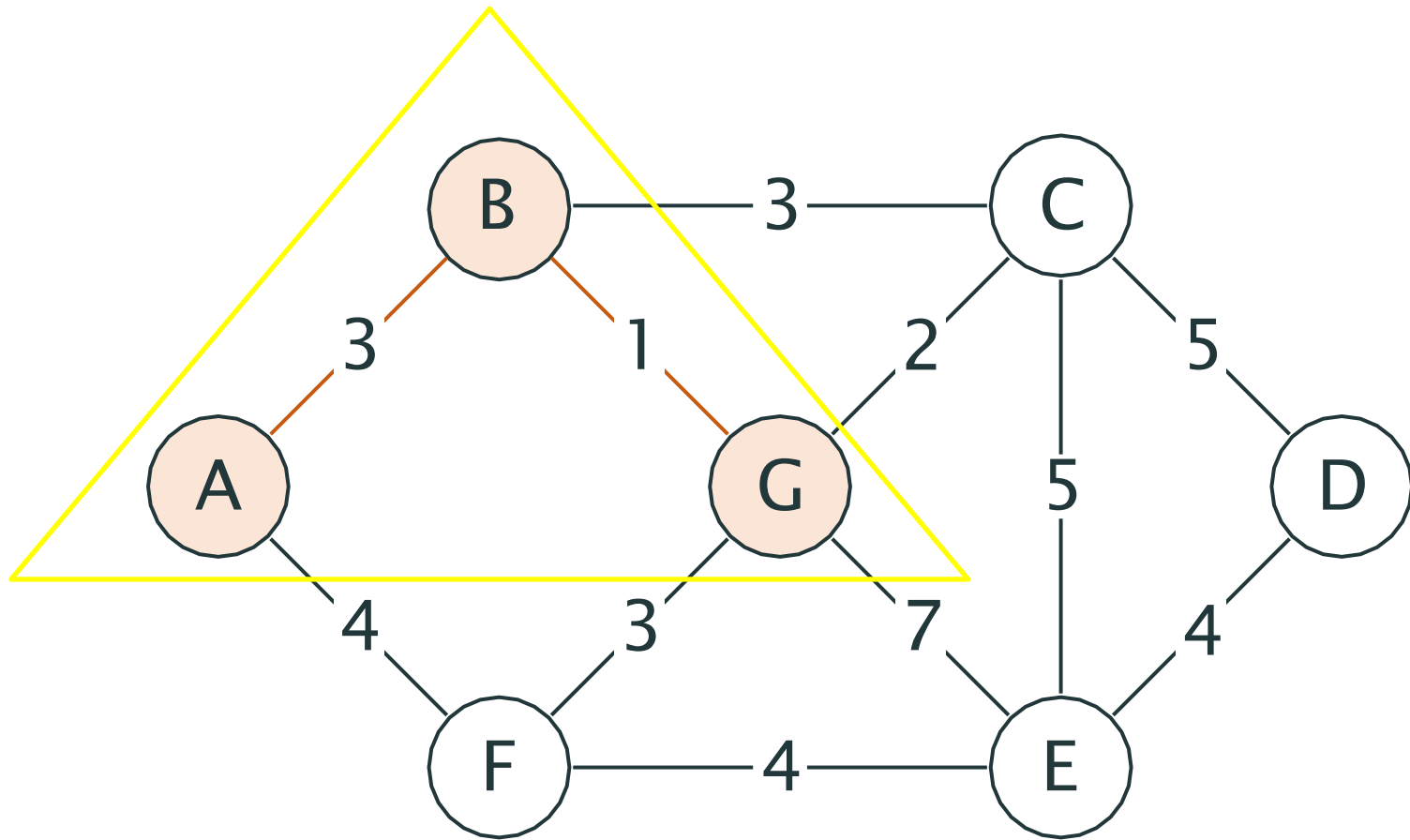


# Prim: illustration

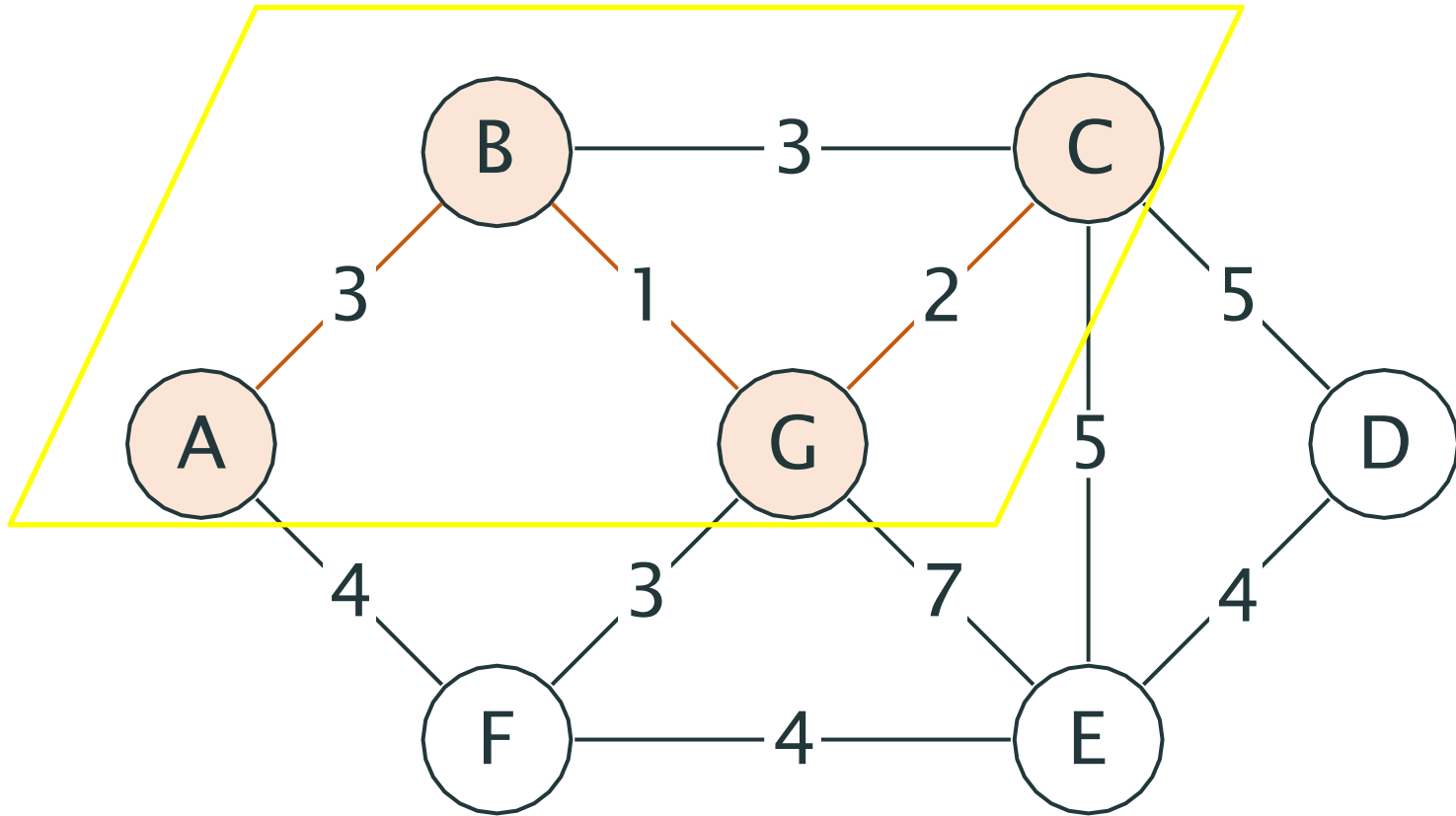




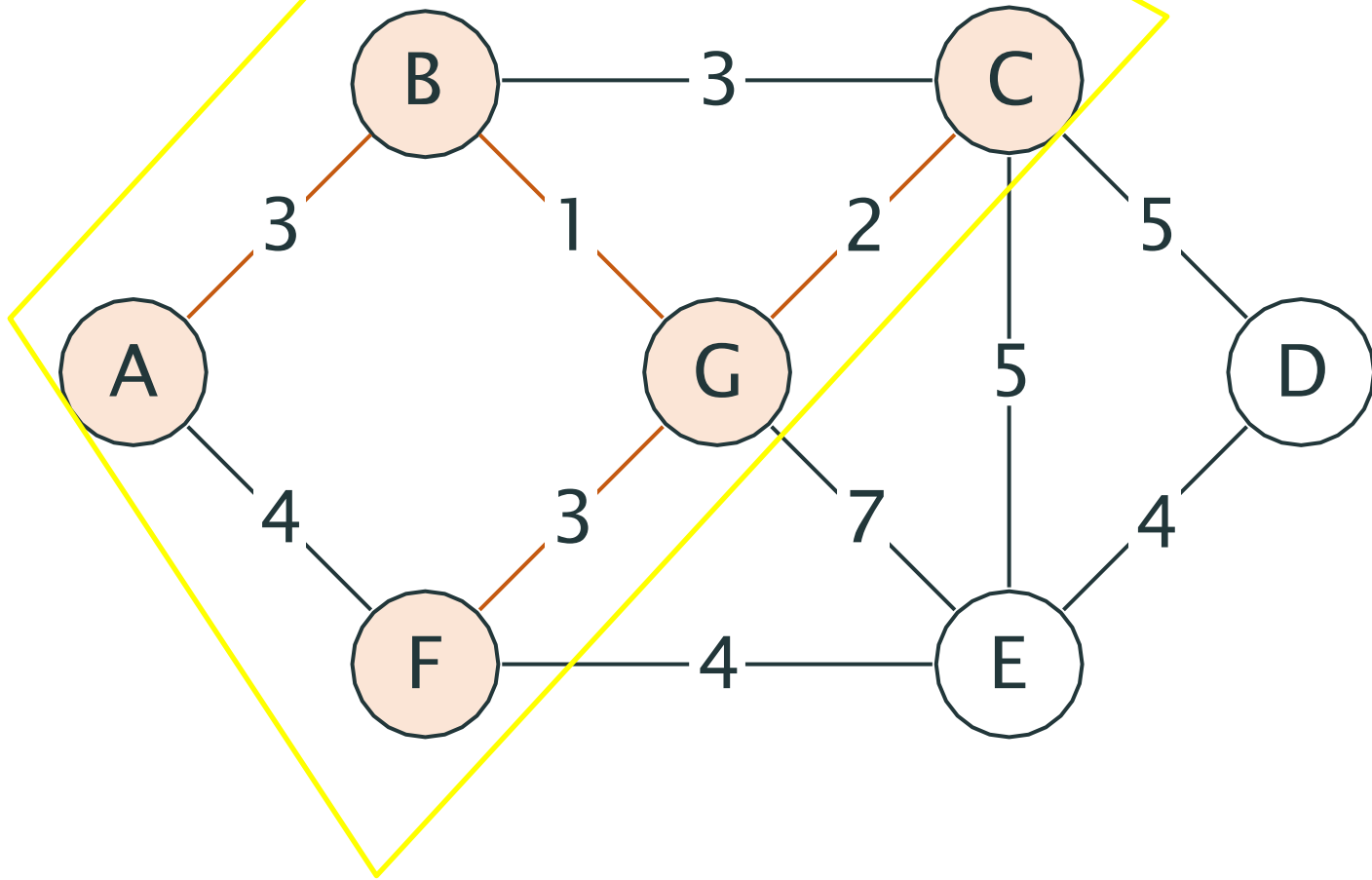
# Prim: illustration



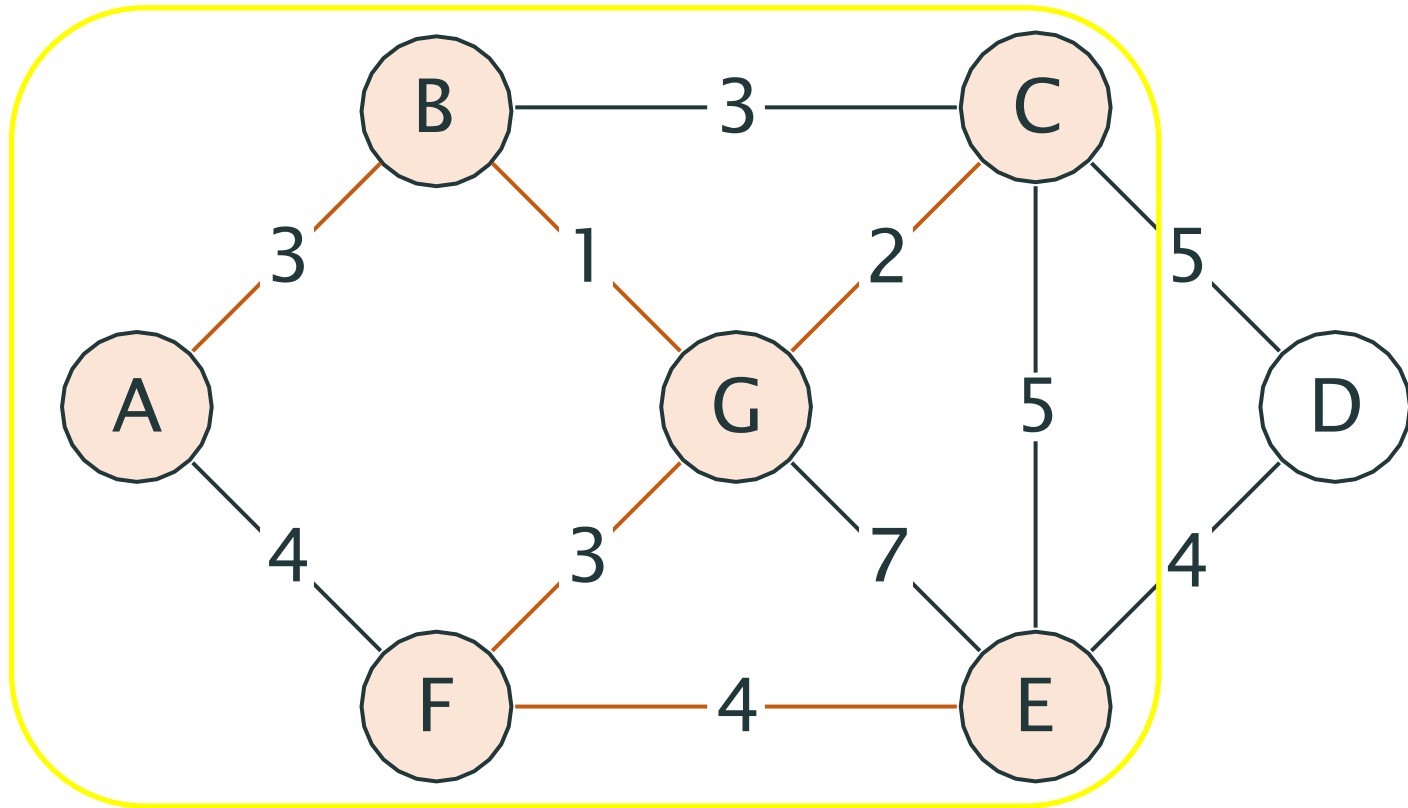
# Prim: illustration



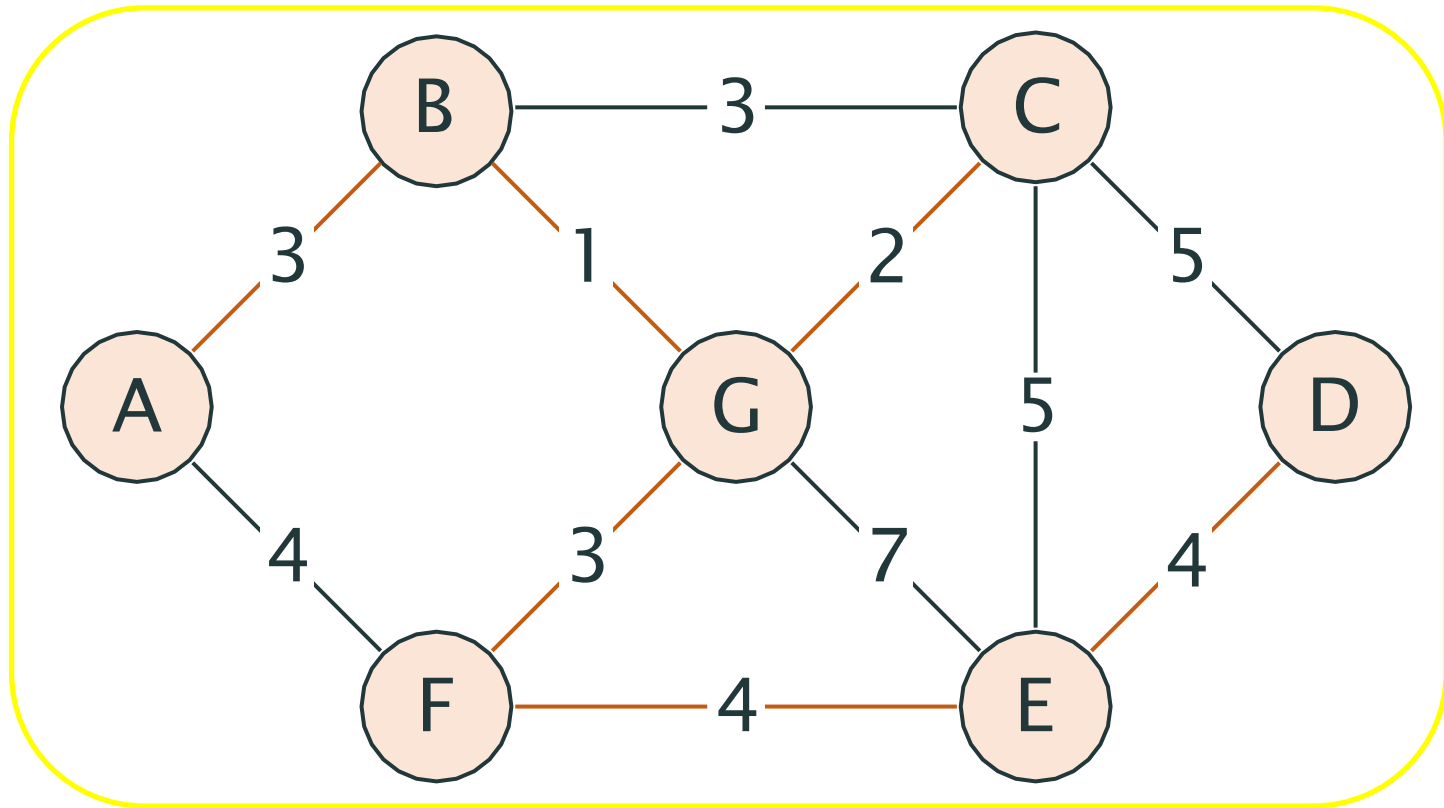
# Prim: illustration



# Prim: illustration



# Prim: illustration



MST cost:  $3 + 1 + 2 + 3 + 4 + 4 = 17$

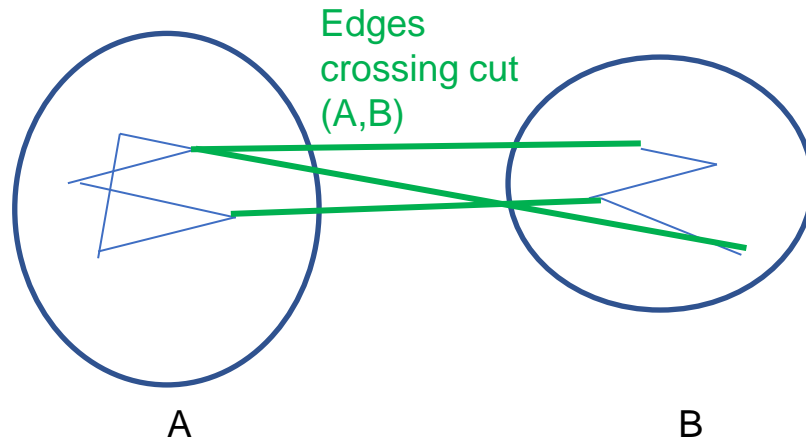
# Correctness

We need to prove:

1. Prim computes a spanning tree  $T^*$
2.  $T^*$  is a MST

# Cuts

- A *cut* is a partition  $(A, B)$  of  $G$  into 2 non-empty subsets (proper subsets)
- How many different cuts can be in a  $G$  with  $n$  vertices? ( $n$ ,  $n^2$ ,  $2^n$ )?



# Empty Crossing Lemma

A graph is not connected  $\Leftrightarrow$  exists cut  $(A,B)$  with no crossing edges

Proof

$\Leftarrow$

- Assume RHS. Pick any  $u \in A$  and  $v \in B$ . Since no edges cross the cut, there is no path from  $u$  to  $v \Rightarrow G$  is not connected

$\Rightarrow$

- Assume LHS. Define  $A = \{\text{all vertices reachable from } u\}$ ,  $u$ 's connected component, and  $B = \{\text{all the remaining vertices in } G\}$ . No edges cross from  $A$  to  $B$ , otherwise  $A$  would absorb  $B$  into a single connected component

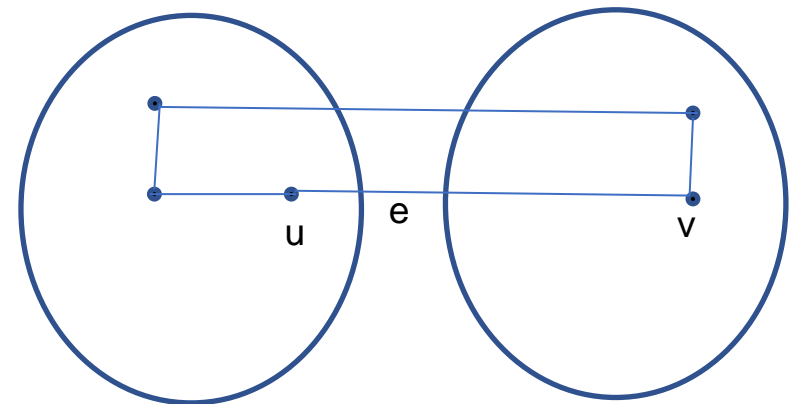


# Cycle Crossing Lemma

If two vertices  $u$  and  $v$  are part of a cycle, then for a cut  $(A,B)$  such that  $u \in A$  and  $v \in B$  there must be at least two crossing edges.

Proof

If there is a path from  $u$  to  $v$  that includes one crossing edge  $e$ , then it must also be a different path from  $v$  to  $u$  to close the cycle. The only way to reach  $u$  from  $v$  is through crossing edges, thus we need at least one more crossing edge to return to  $A$ .



# Lonely Edge Corollary

If there is a single crossing edge  $e$  in cut  $(A,B)$ ,  $e$  is not a part of any cycle

# Theorem 1. Prim outputs a Spanning Tree

## Proof

- Consider a cut of  $G$  into  $(X, V-X)$  at some step of the algorithm.
- Next, we add a single crossing edge to  $T$ , and the vertex on the opposite end of this edge gets added to  $X$ .
- By the Lonely Edge Corollary addition of the first crossing edge does not create a cycle in  $T$ , and we never explore other crossing edges for this cut again.
- Thus the produced  $T$  is acyclic. (1)
- $T$  is also connected. According to the Empty Crossing Lemma there must be at least one edge from  $X$  to  $V-X$ , if  $G$  is connected. (2)
- Hence the algorithm adds  $n-1$  edges and spans all  $n$  nodes of  $G$ : (1) acyclic, (2) connected graph with all  $n$  vertices and  $n-1$  edges is a Spanning Tree

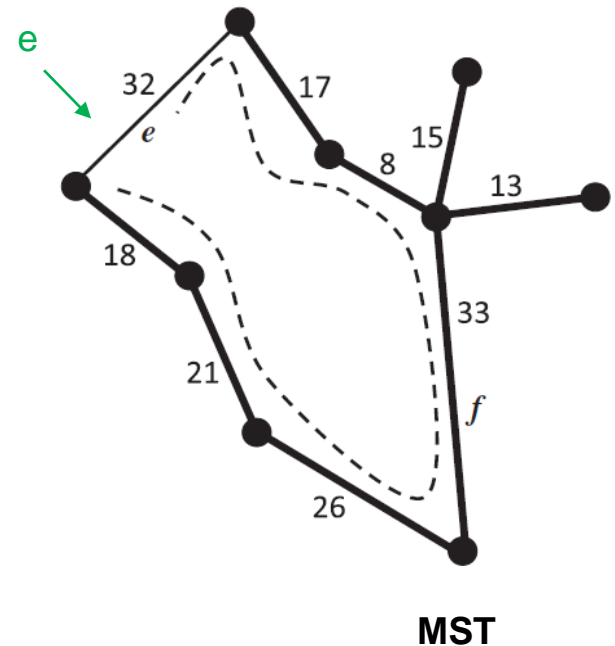
# The MST Cycle Lemma

Let  $G$  be a weighted connected graph, and let  $T$  be a minimum spanning tree for  $G$ .

If  $e$  is an edge of  $G$  that is not in  $T$ , then if we add  $e$  to the tree this will create a cycle.

## Proof

Because any spanning tree already contains a unique path between any pair of vertices, if we add one more edge this will create an alternative path – a cycle.



# The Non-MST Edge Cost Lemma

Let  $G$  be a weighted connected graph, and let  $T$  be a minimum spanning tree for  $G$ . If  $e$  is an edge of  $G$  that is not in  $T$ , the weight of  $e \geq$  the weight of any edge in the cycle created by adding  $e$  to  $T$ .

## Proof

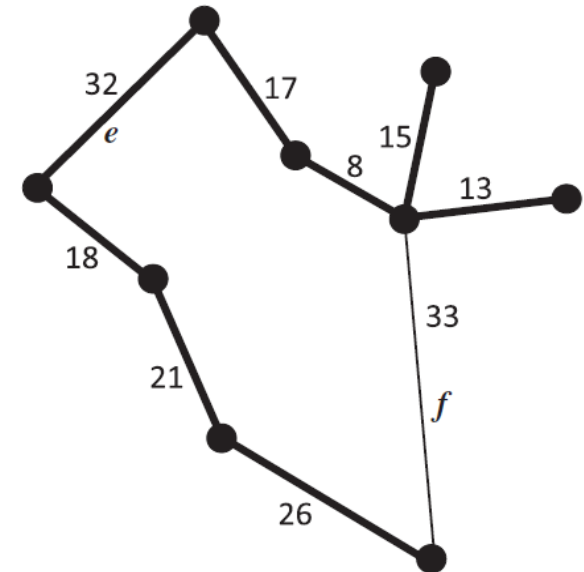
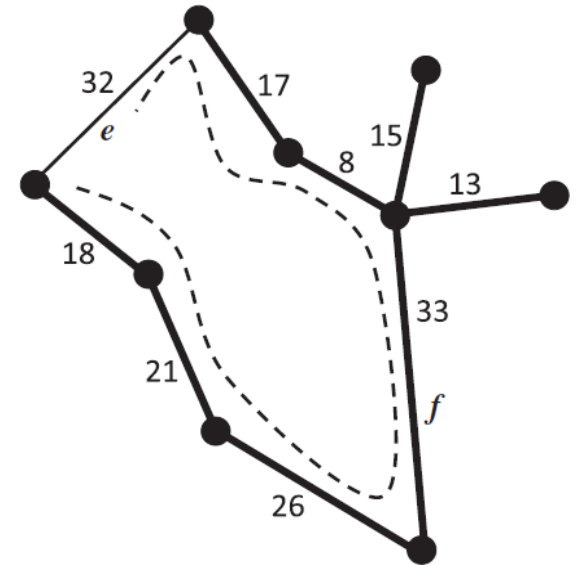
If  $e$  is not in  $T$ , then adding  $e$  to  $T$  creates a cycle,  $C$ . Suppose, for the sake of contradiction, that there is an edge  $f$  on this cycle, whose weight is:  $w(f) > w(e)$ .

Then we can remove  $f$  from  $T$  and replace it with  $e$ , and this will result in a spanning tree,  $T'$ , whose total weight is less than the total weight of  $T$ .

But the existence of such a better tree,  $T'$ , would contradict the fact that  $T$  is a minimum spanning tree. So no such edge,  $f$ , can exist.

# Example

- Any nontree edge must have weight that is  $\geq$  every edge in the cycle created by that edge and a minimum spanning tree.
- Suppose edge  $e$  has weight 32 and edge  $f$  in the same cycle has weight 33. Edge  $f$  is a part of MST (shown with bold edges), and edge  $e$  is not.
- But then we could replace  $f$  by  $e$  and get a spanning tree with lower total weight, which would contradict the fact that we started with a minimum spanning tree.

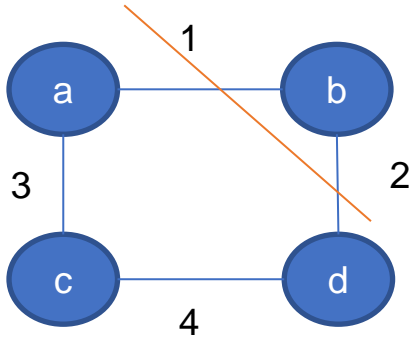


# Cut Crossing Theorem

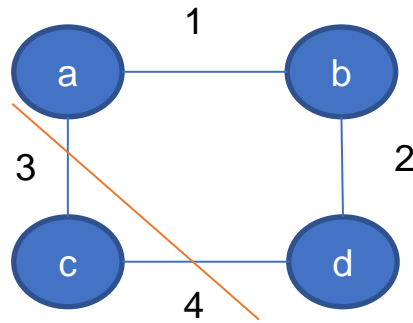
- Let  $G$  be a weighted connected graph, and let  $(A, B)$  be some possible cut of  $G$ .
- If  $e$  is the cheapest edge crossing cut  $(A, B)$ , then  $e$  must be a part of some MST

# What we are trying to prove

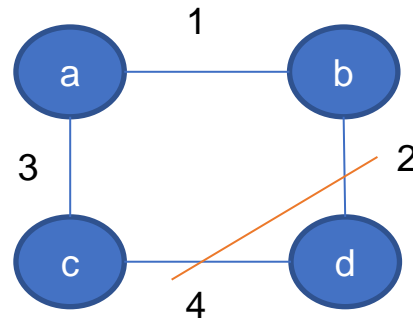
If we have an edge in a graph and you can find just a single cut for which this edge has the min cost among all edges crossing this cut, then this edge **must** belong to the MST (or one of MSTs in case when the weights are not unique)



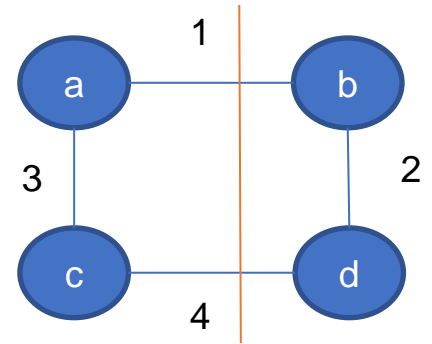
Cut 1  
Edge 1 must be in  
MST



Cut 2  
Edge 3 must be in  
MST



Cut 3  
Edge 2 must be in  
MST



Cut 4  
Edge 1 must be in  
MST

Note that edge 4 is never min of all crossing edges, no matter how we cut – so edge 4 is not in MST

# Proof

- Let  $T$  be a minimum spanning tree of  $G$ . If  $T$  does not contain edge  $e$ , the addition of  $e$  to  $T$  must create a cycle.
- Therefore, there is some edge  $f$  of this cycle that has one endpoint in partition  $A$  and the other in partition  $B$ . Moreover,  $w(e) \leq w(f)$ .
- If we remove  $f$  from  $T \cup \{e\}$ , we obtain a spanning tree whose total weight is no more than before.
- Since  $T$  was a minimum spanning tree, this new tree must also be a minimum spanning tree.

In fact, if the weights in  $G$  are distinct, then the minimum spanning tree is unique



# Theorem 2. Prim outputs a Minimum Spanning Tree

- If we consider a cut of  $G$  into  $X$  (MST so far) and  $V-X$  (remaining graph), then according to the **Cut Crossing Theorem** the cheapest edge for this cut must be a part of some MST
- Therefore, choosing the crossing edge with the minimum weight is a **safe move**.
- Because Prim's algorithm always adds a crossing edge of min-weight, the spanning tree produced by this algorithm is a Minimum Spanning Tree



# Algorithm Kruskal\_MST (graph $G(V,E)$ )

$E' :=$  edges of  $G$  sorted by weights

$T := \emptyset$

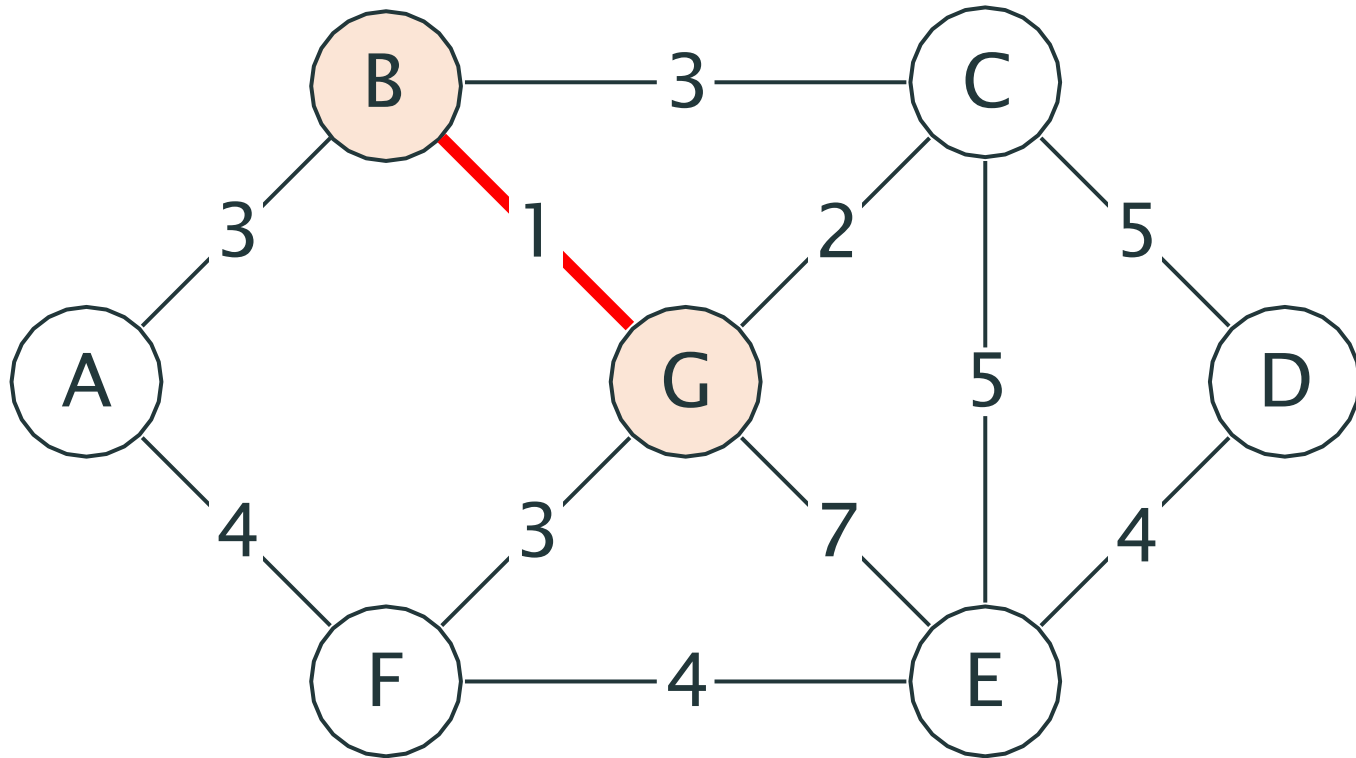
for  $i$  from 1 to  $m$ :

    if  $T \cup \{E'[i]\}$  has no cycles

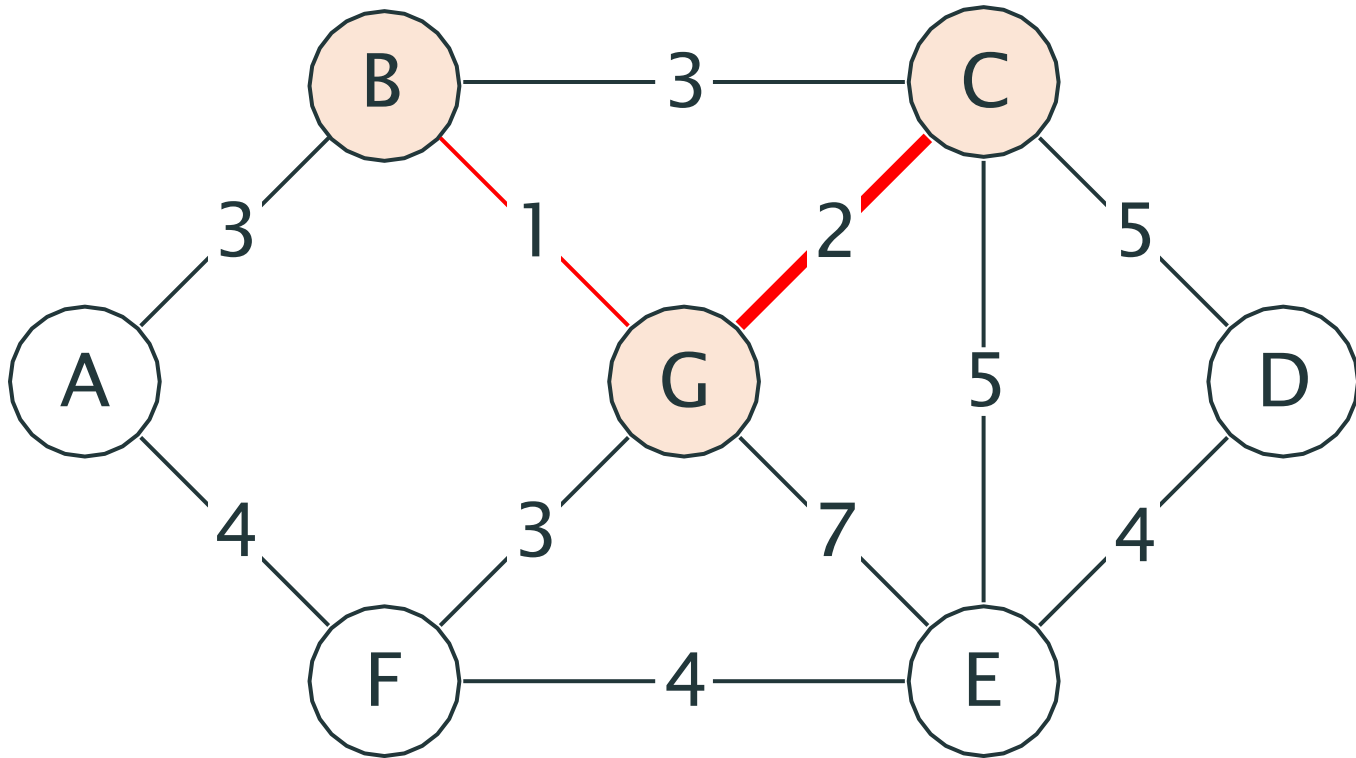
        add  $E'[i]$  to  $T$

return  $T$

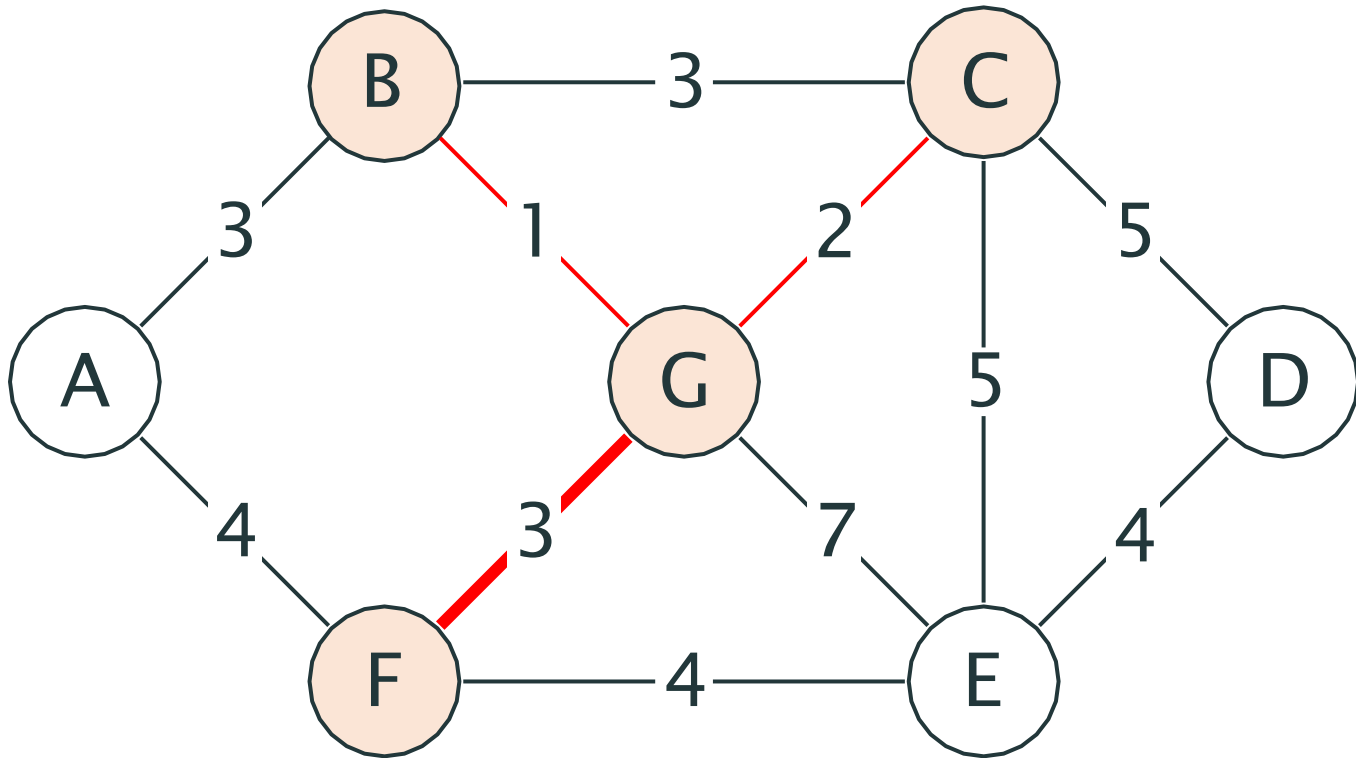
# Kruskal illustration



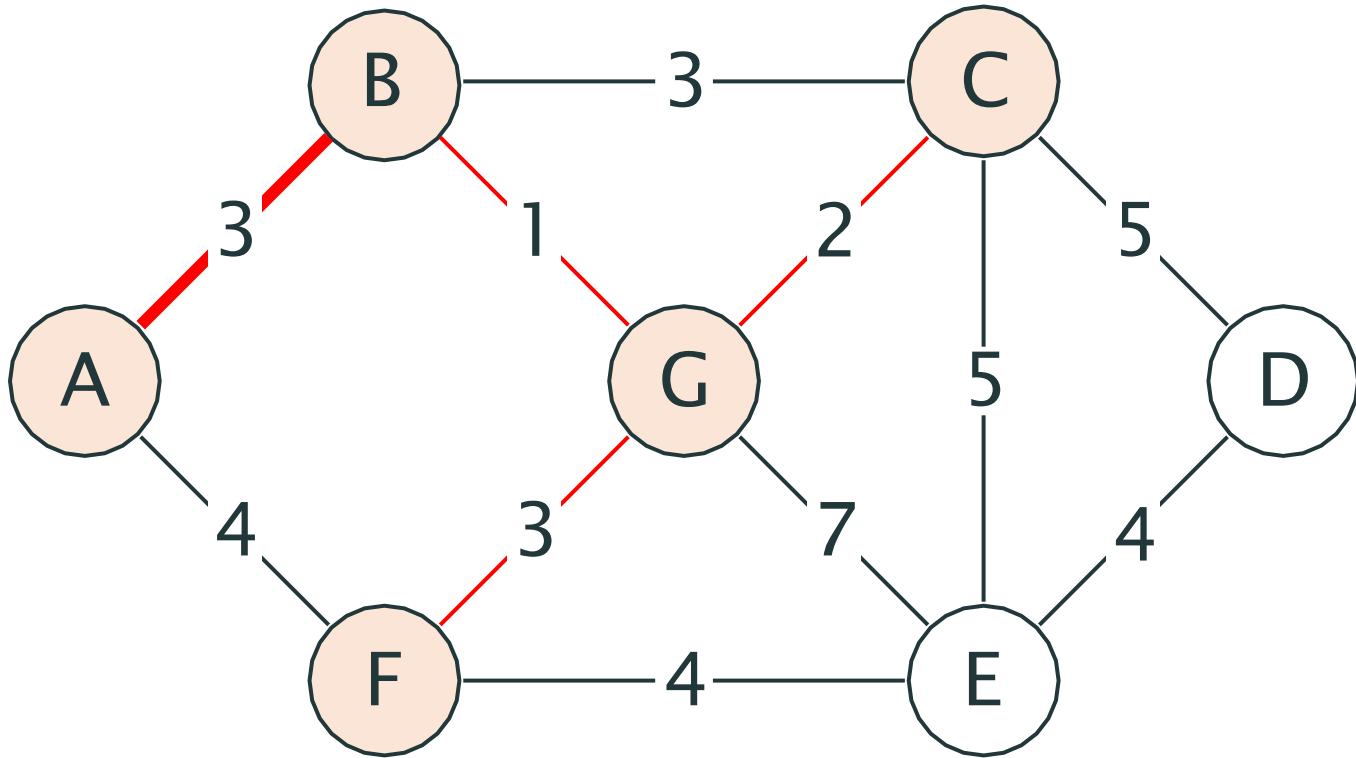
# Kruskal illustration



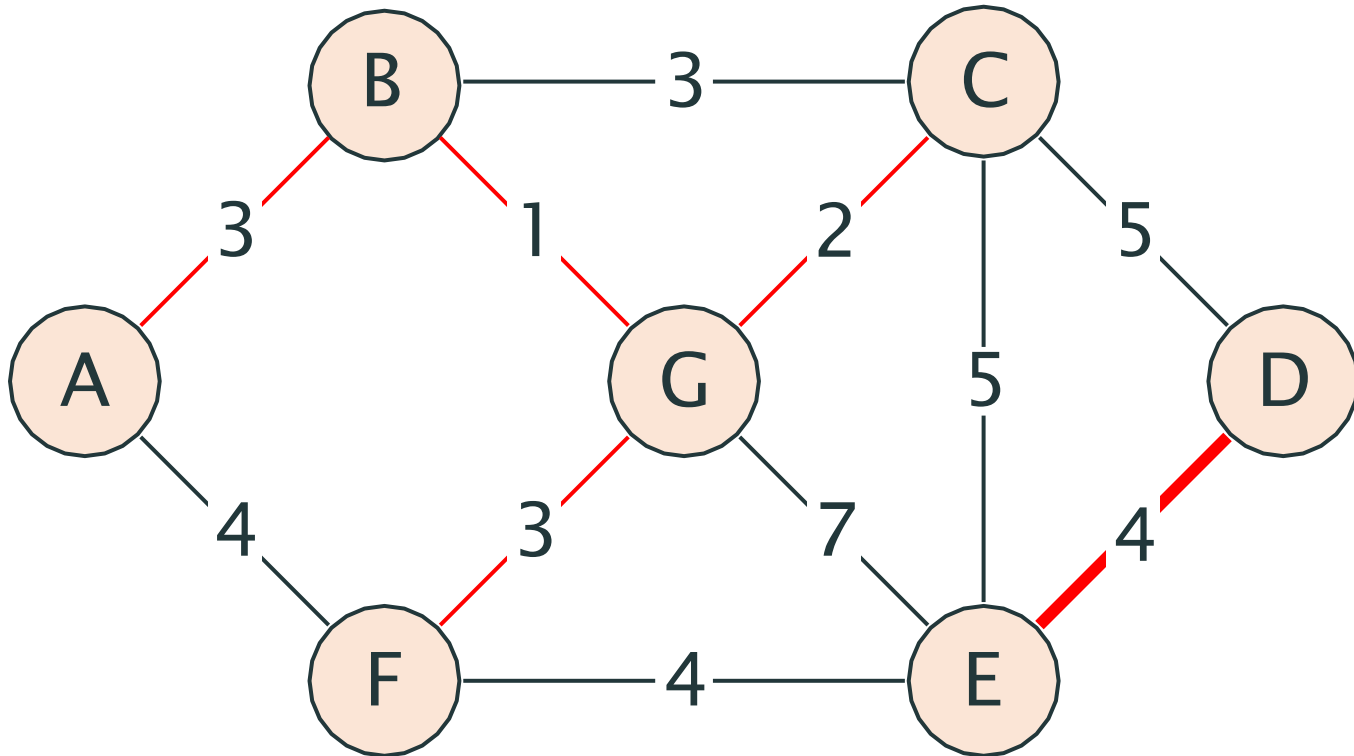
# Kruskal illustration



# Kruskal illustration

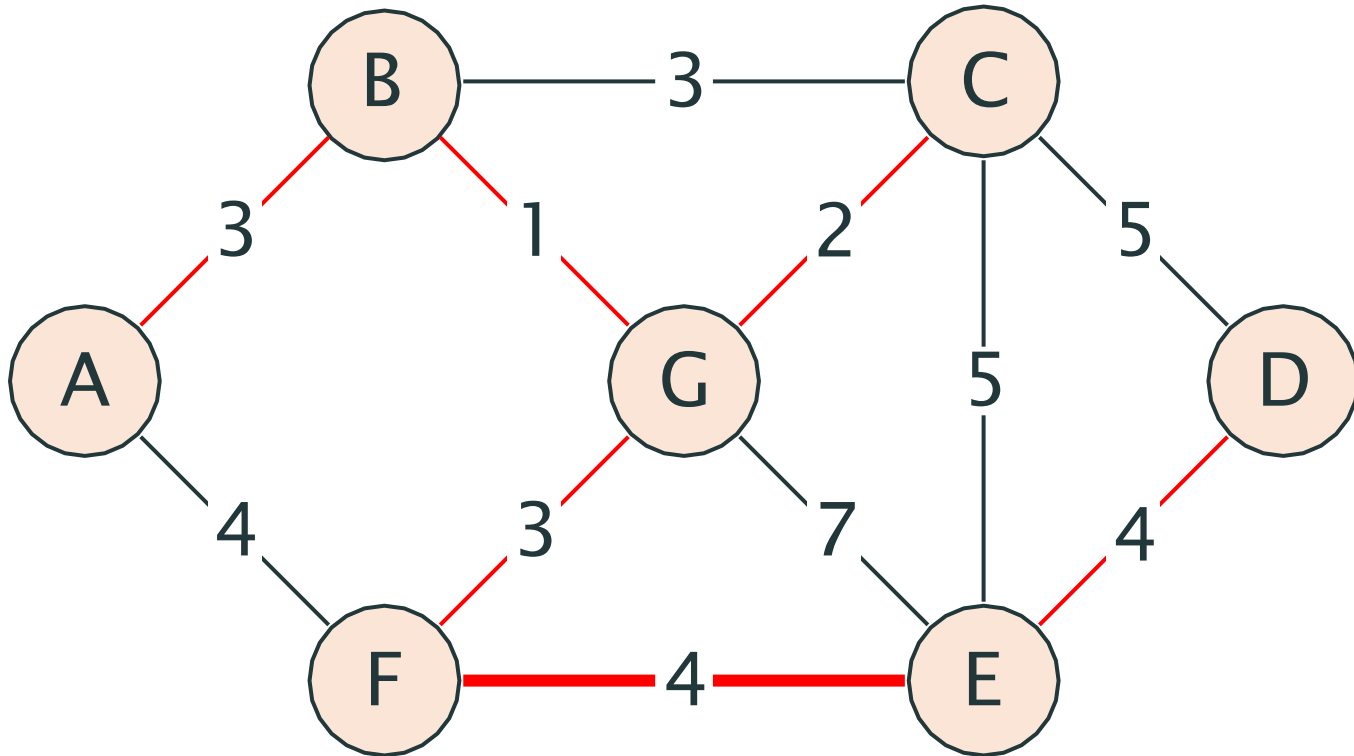


# Kruskal illustration



Note that at this point T is not even a spanning tree  
(not connected)

# Kruskal illustration



$$\text{MST cost: } 1 + 2 + 3 + 3 + 4 + 4 = 17$$



# Kruskal correctness (sketch)

## Part I. Kruskal outputs Spanning Tree

- We explicitly check not to introduce cycles, and we add total  $n-1$  edges connecting  $n$  nodes. Thus Kruskal produces a Spanning Tree of  $G$

## Part II. The tree is MST

- At each step, the algorithm adds a cheapest edge which does not create a cycle. This means that this is the first of crossing edges if we consider a cut of  $G$  into a connected component and remaining nodes
- By the **Cut Crossing Theorem**, this edge must be a part of some MST

# Algorithm Baruvka\_MST (graph $G(V,E)$ )

$T := \emptyset$

# We create  $n$  clusters, each with a single node

assign each vertex  $v_i$  to cluster  $C_i$

while  $\text{length}(\text{clusters}) \neq 1$ :

  for each cluster  $A$  in clusters:

    select min-cost of all edges  $(u,v)$

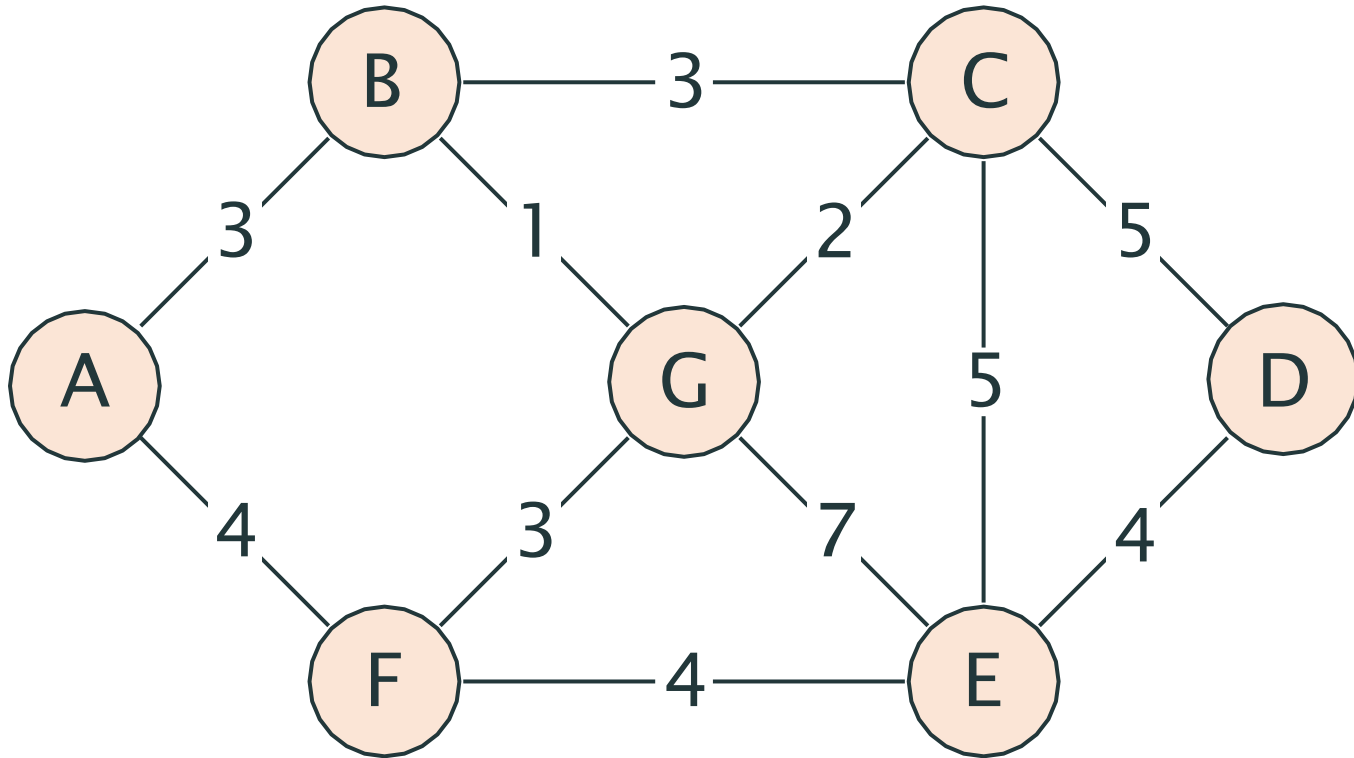
      such that  $u \in A$  and  $v \notin A$  ( $v \in B$ )

    add edge  $(u,v)$  to  $T$

    merge  $A$  and  $B$  into a single cluster  $A$

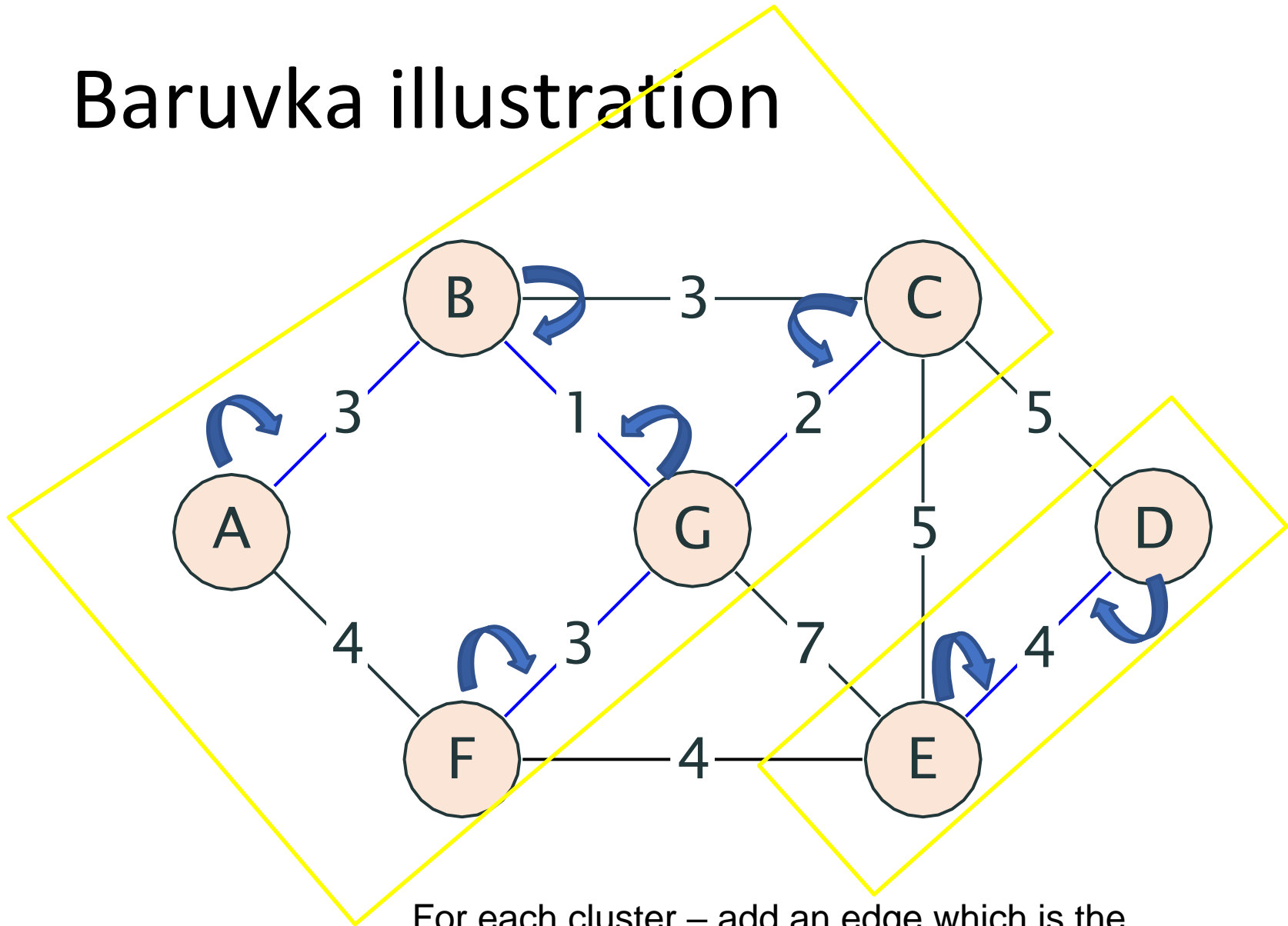
return  $T$

# Baruvka illustration



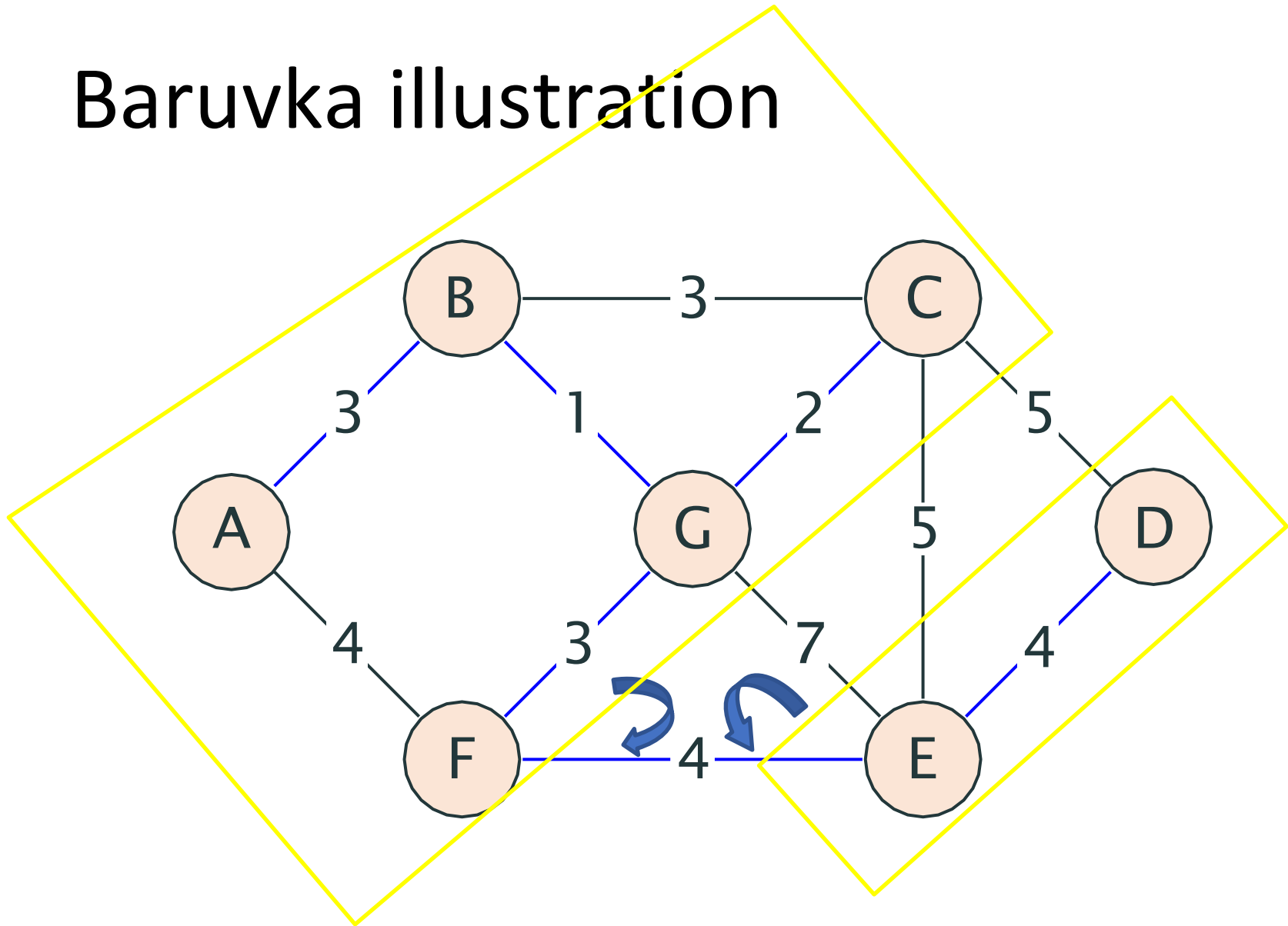
Each node as a single cluster, no edges

# Baruvka illustration



For each cluster – add an edge which is the  
cheapest from this cluster  
After first iteration: only 2 clusters remain

# Baruvka illustration



After second iteration – 1 cluster:

$$\text{MST cost: } (3 + 1 + 2 + 3) + (4) + (4) = 17$$

# MST algorithms: summary

All the algorithms follow some greedy strategy.

## Algorithm MST (graph $G(V,E)$ )

$T := \emptyset$  # collects edges of the future MST

while  $|T| \leq |V| - 1$ :

    select next edge  $e$  from  $E$  # safe greedy move

$T := T \cup e$

return  $T$

Correctness proofs are all based on the  
Cut Crossing Theorem