



CS202 – Data Structures

LECTURE-21

Graphs – IV

Shortest Path and MST

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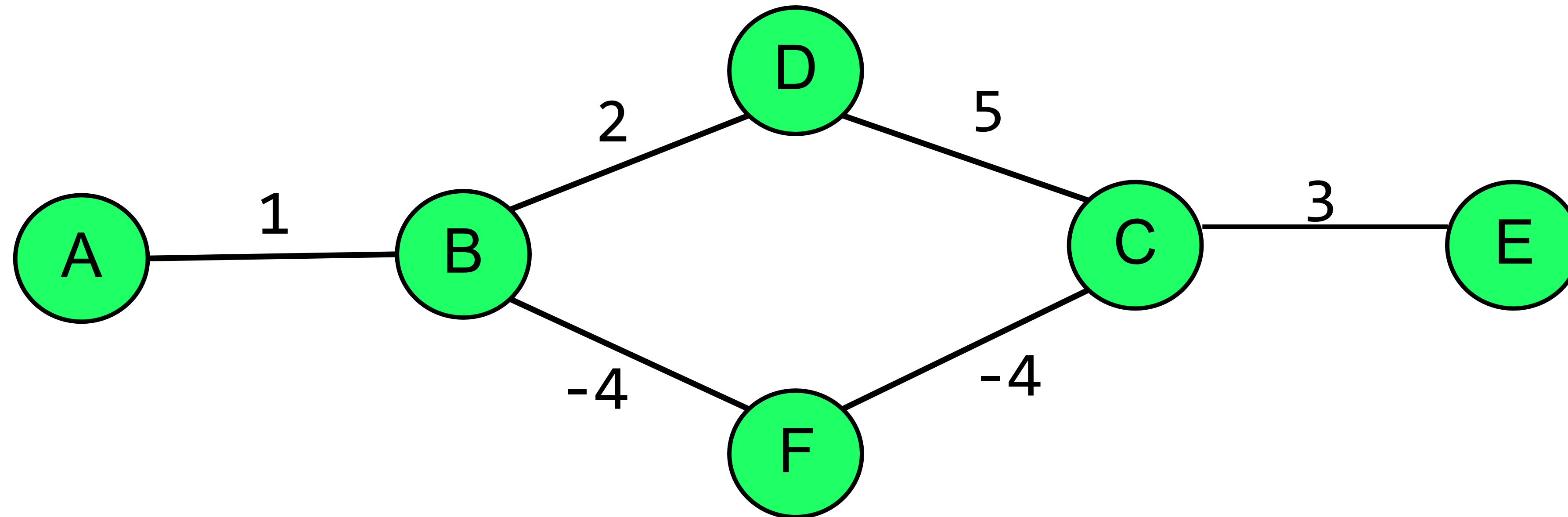
Agenda

- Shortest path algorithm for negative weights
- Minimum Spanning Trees

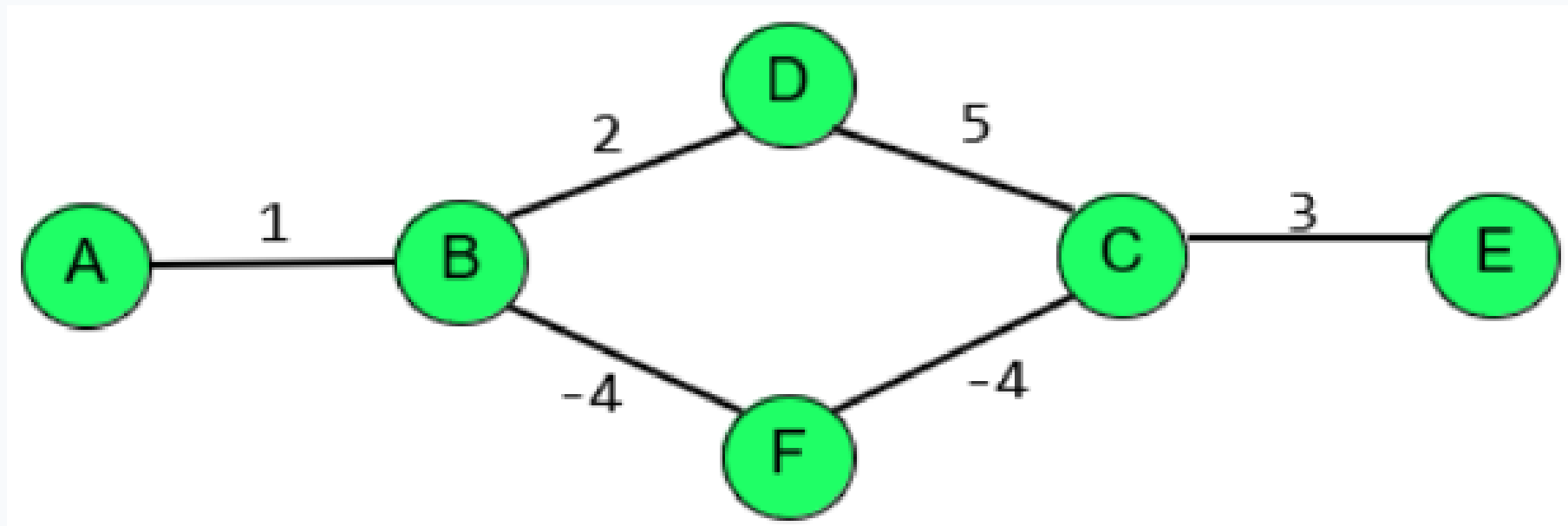
Dijkstra's algorithm - Summary

- Finds single-source shortest paths in a **weighted graph** (directed or undirected) with **no negative-weight edges**
- An example of a greedy algorithm:
 - At each step, **always does what seems best** at that step
 - A locally optimal step, not necessarily globally optimal
 - **Once a vertex is known, it is not revisited**
 - Turns out Dijkstra's algorithm is globally optimal

What is the shortest Path from A to E?



What is the weight of the shortest path from A to E in the given graph?

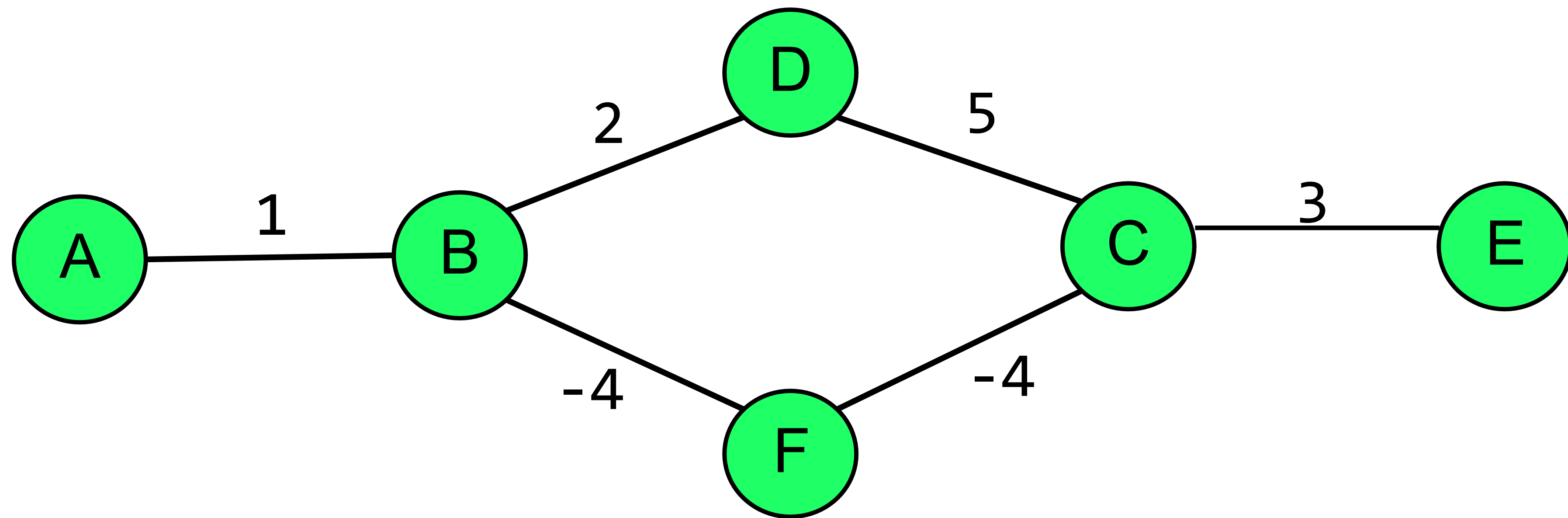


Nobody has responded yet.

Hang tight! Responses are coming in.

What is the shortest Path from A to E?

- The shortest path from A-E **is not well-defined** on this graph due to negative-cost cycle!



$$\text{Total Cycle Weight} = 2 + 5 - 4 - 4$$

How to deal with negative edge weights?

- Dijkstra **fails with negative edge** weights
- Many real-world problems, for example, currency exchange or network routing involve such edges
- **Solution:**
 - Bellman-Ford's Algorithm
 - Relax all edges $V-1$ times

Why V-1 Edge Relaxations?

- Edge Relaxation
 - If the path to v via u is shorter than the best path known so far, update it.

if $\text{dist}[u] + \text{weight}(u, v) < \text{dist}[v]$:

$\text{dist}[v] = \text{dist}[u] + \text{weight}(u, v)$
 - Relaxing edge once will compute the shortest path for vertices that are 1 edge away
 - Why not V iterations?

Bellman Ford's Algorithm – Key Idea

- **Initialize distance** to all nodes as ∞ , except the source (0)
- **Relax all edges** $V-1$ times:
If $\text{dist}[u] + \text{weight}(u,v) < \text{dist}[v]$
update $\text{dist}[v]$

How can we detect a Negative Cycle?

Do one more pass: if any edge still relaxes, a negative cycle exists

Pseudocode & Efficiency

```
bellmanFord(Graph G, Node v) {  
    for each vertex:
```

```
         $D[u] = \infty$ 
```

```
     $D[v] = 0$  //source vertex
```

```
    Repeat  $v-1$  times:
```

```
        for each edge  $(b,a)$  in  $G$  {  
            if( $D[b] + \text{weight}((b,a)) < D[a]$ ) {
```

```
                 $D[a] = D[b] + \text{weight}(b,a)$ 
```

```
                 $a.\text{path} = b$  //for computing actual paths
```

```
            }
```

```
        }
```

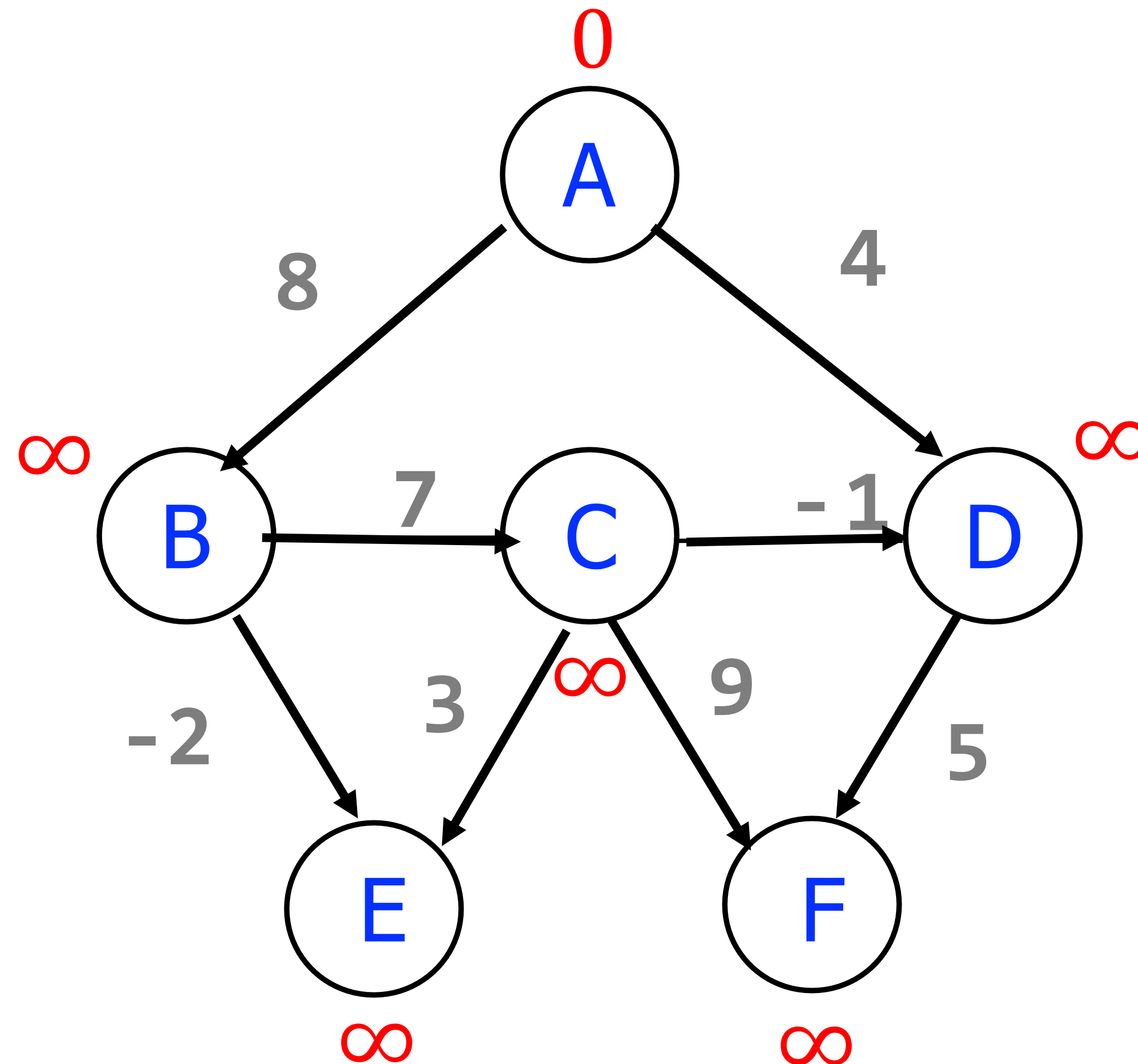
```
    }
```

$O(|V|)$

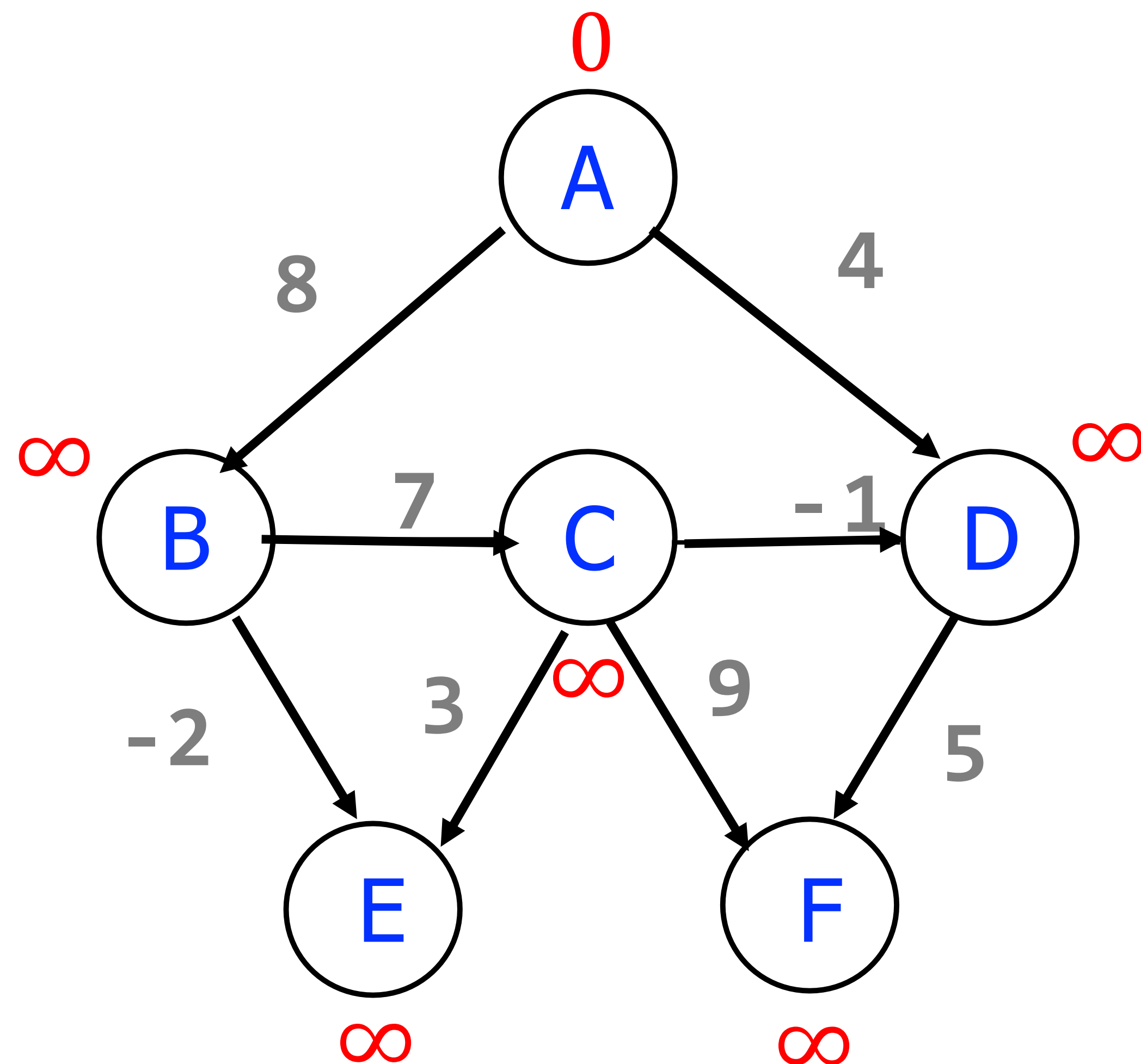
$O(|V| |E|)$

$O(|V| |E|)$

Bellman-Ford's Algorithm Example



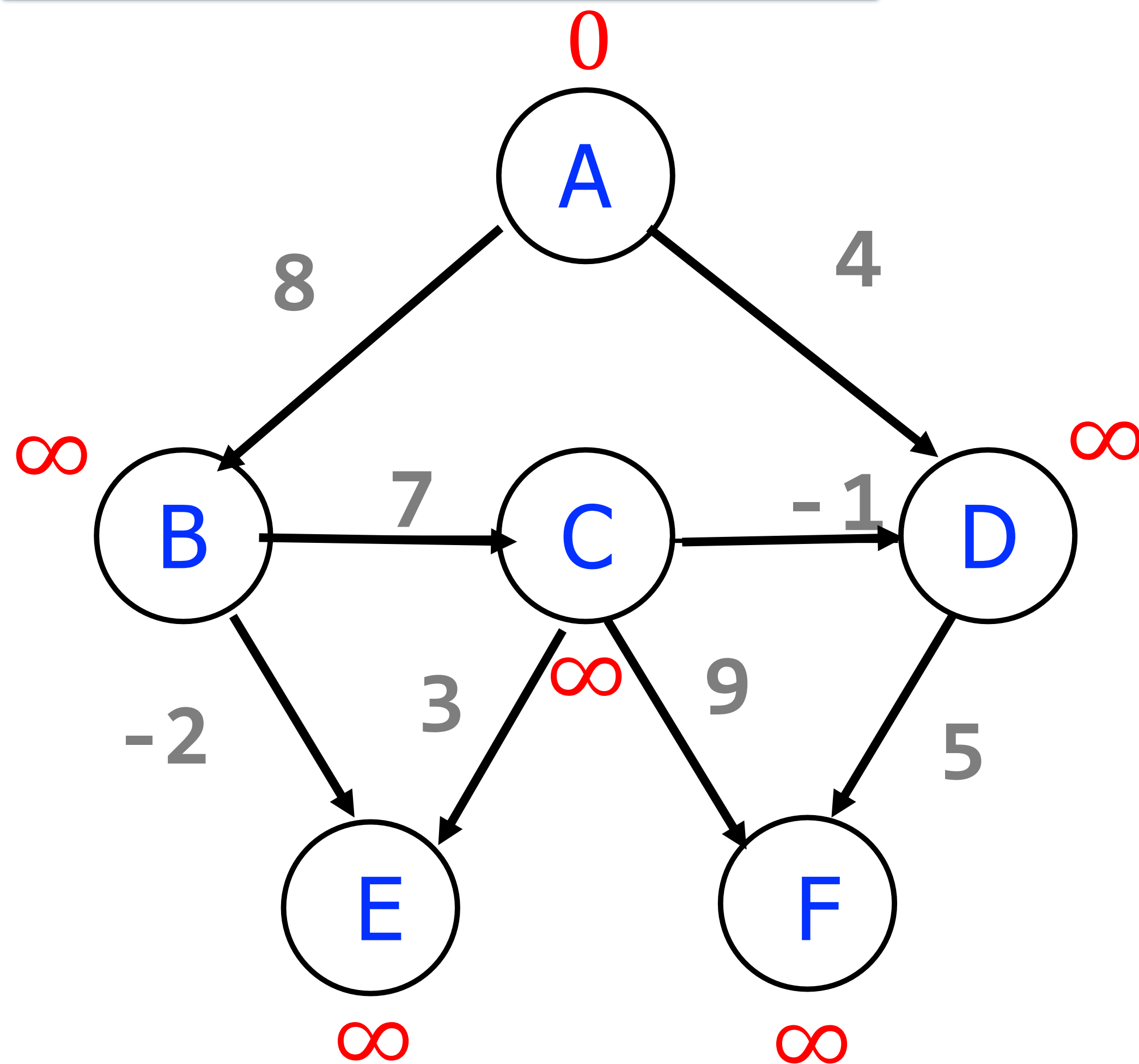
Bellman-Ford's Algorithm Example



Edge	Dist[]	parent
A \rightarrow B	0	-
A \rightarrow D	∞	-
B \rightarrow C	∞	-
C \rightarrow D	∞	-
D \rightarrow F	∞	-
C \rightarrow F	∞	-
C \rightarrow E	∞	-
B \rightarrow E	∞	-

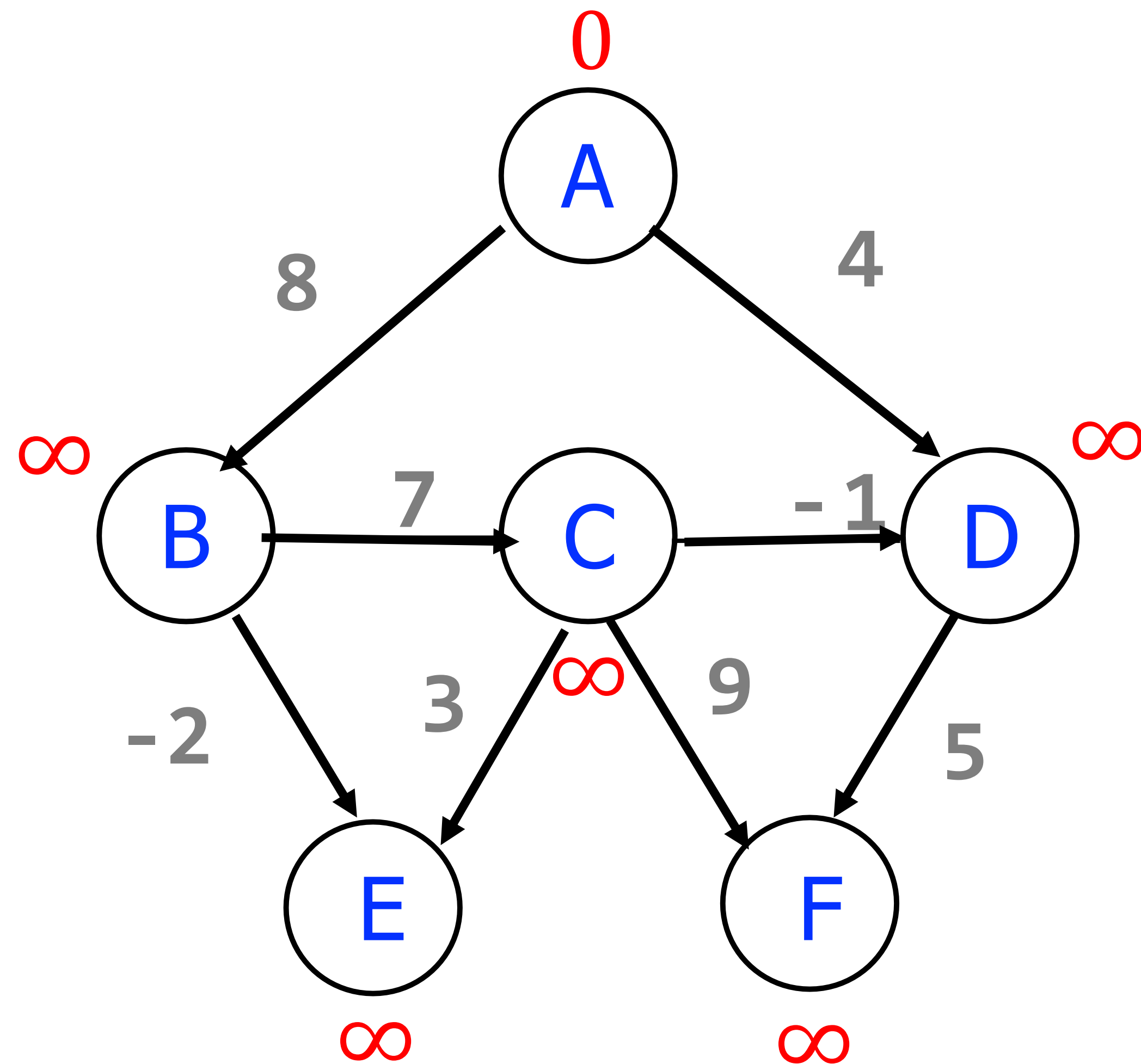
Bellman-Ford's Algorithm – 1st Iteration

Compute distances.



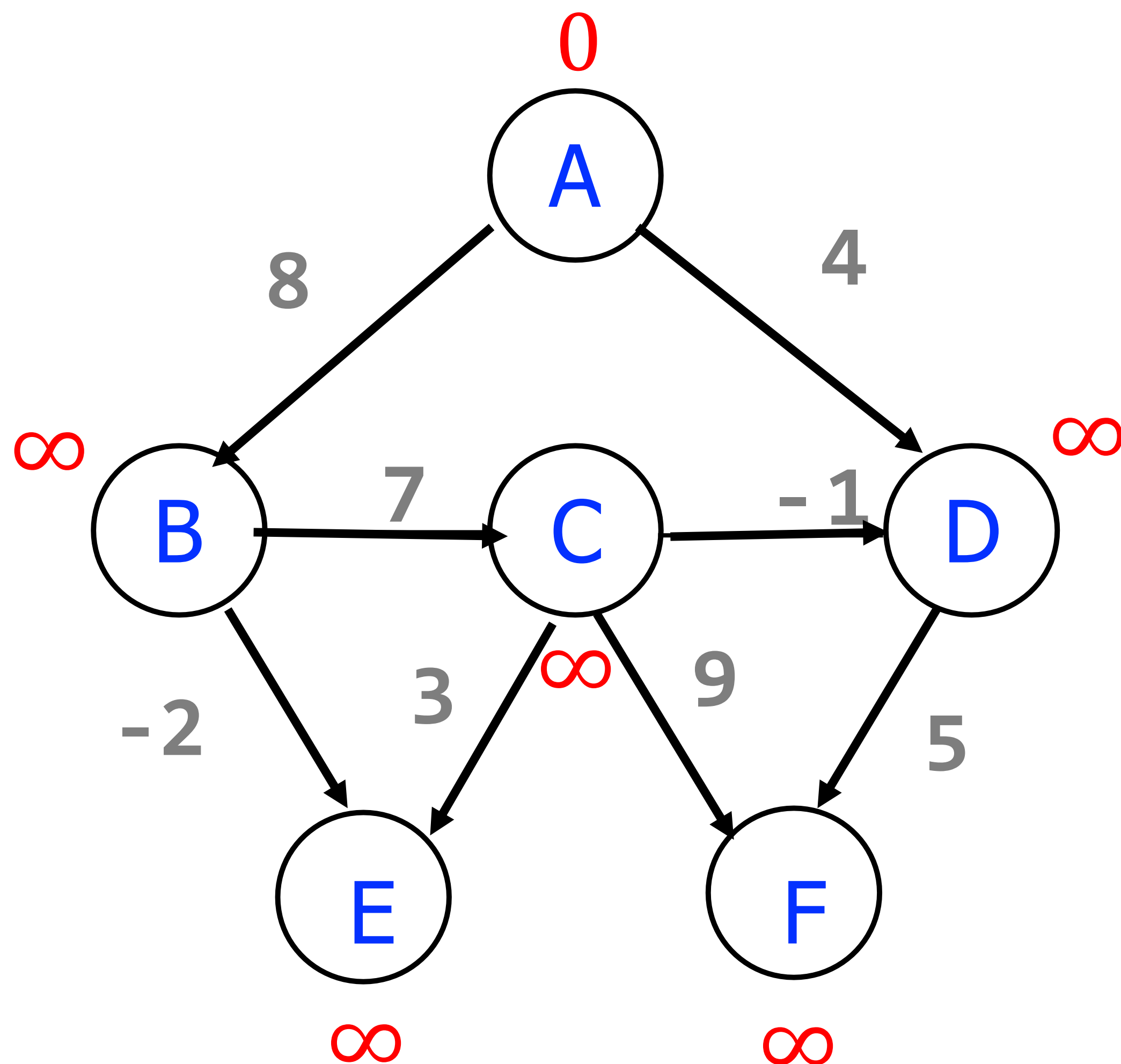
Edge	Dist[]	parent
A → B	$\text{dist}[b] = \min(\text{dist}[b], 8 + \text{dist}[a]) = 8$	A
A → D	$\text{dist}[d] = \min(\text{dist}[d], 4 + \text{dist}[a]) = 4$	A
B → C	$\text{dist}[c] = 7 + \text{dist}[b] = 15$	B
C → D		
D → F		
C → F		
C → E		
B → E		

Bellman-Ford's Algorithm – 1st Iteration



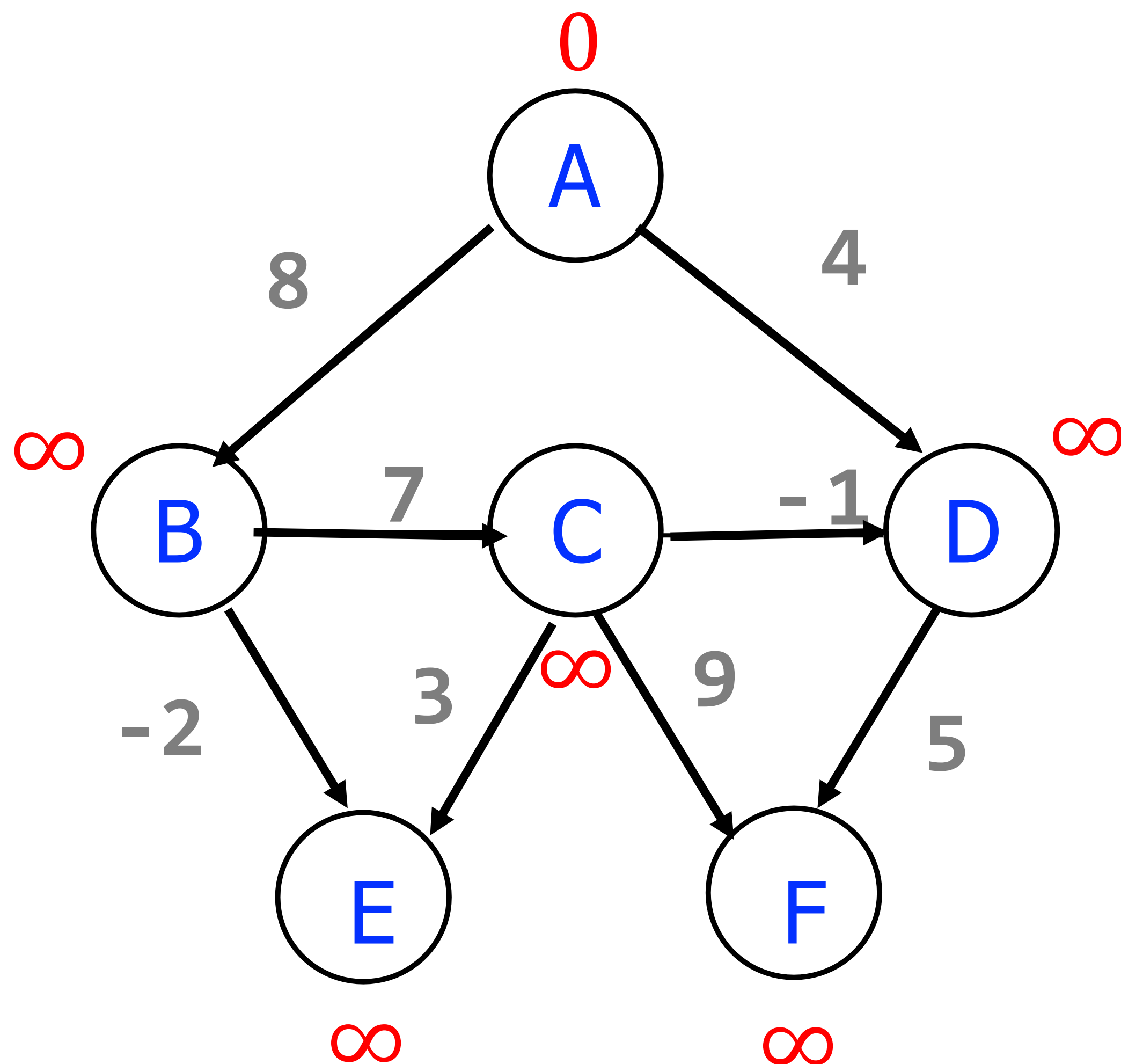
Edge	Dist[]	parent
A → B	$\text{dist}[b] = \min(\text{dist}[b], 8 + \text{dist}[a]) = 8$	A
A → D	$\text{dist}[d] = \min(\text{dist}[d], 4 + \text{dist}[a]) = 4$	A
B → C	$\text{dist}[c] = 7 + \text{dist}[b] = 15$	B
C → D	$\text{Dist}[d] = 4$	A
D → F	$\text{Dist}[f] = 9$	D
C → F	$\text{Dist}[f] = 9$	D
C → E	$\text{Dist}[e] = 18$	C
B → E	$\text{Dist}[e] = 6$	B

Bellman-Ford's Algorithm- 2nd Iteration



Edge	Dist[]	Dist[]	Parent
A → B	dist[b] = 8		A
A → D	Dist[d] = 4		A
B → C	Dist[c] = 15		B
C → D	Dist[d] = 4		A
D → F	Dist[f] = 9		D
C → F	Dist[f] = 9		D
C → E	Dist[e] = 18		C
B → E	Dist[e] = 6		B

Bellman-Ford's Algorithm- 2nd Iteration



Edge	Dist[]	Dist[]	parent
A → B	dist[b] = 8	dist[b] = 8	A
A → D	Dist[d] = 4	Dist[d] = 4	A
B → C	Dist[c] = 15	Dist[c] = 15	B
C → D	Dist[d] = 4	Dist[d] = 4	A
D → F	Dist[f] = 9	Dist[f] = 9	D
C → F	Dist[f] = 9	Dist[f] = 9	D
C → E	Dist[e] = 18	Dist[e] = 18	C
B → E	Dist[e] = 6	Dist[e] = 6	B

Spanning Trees

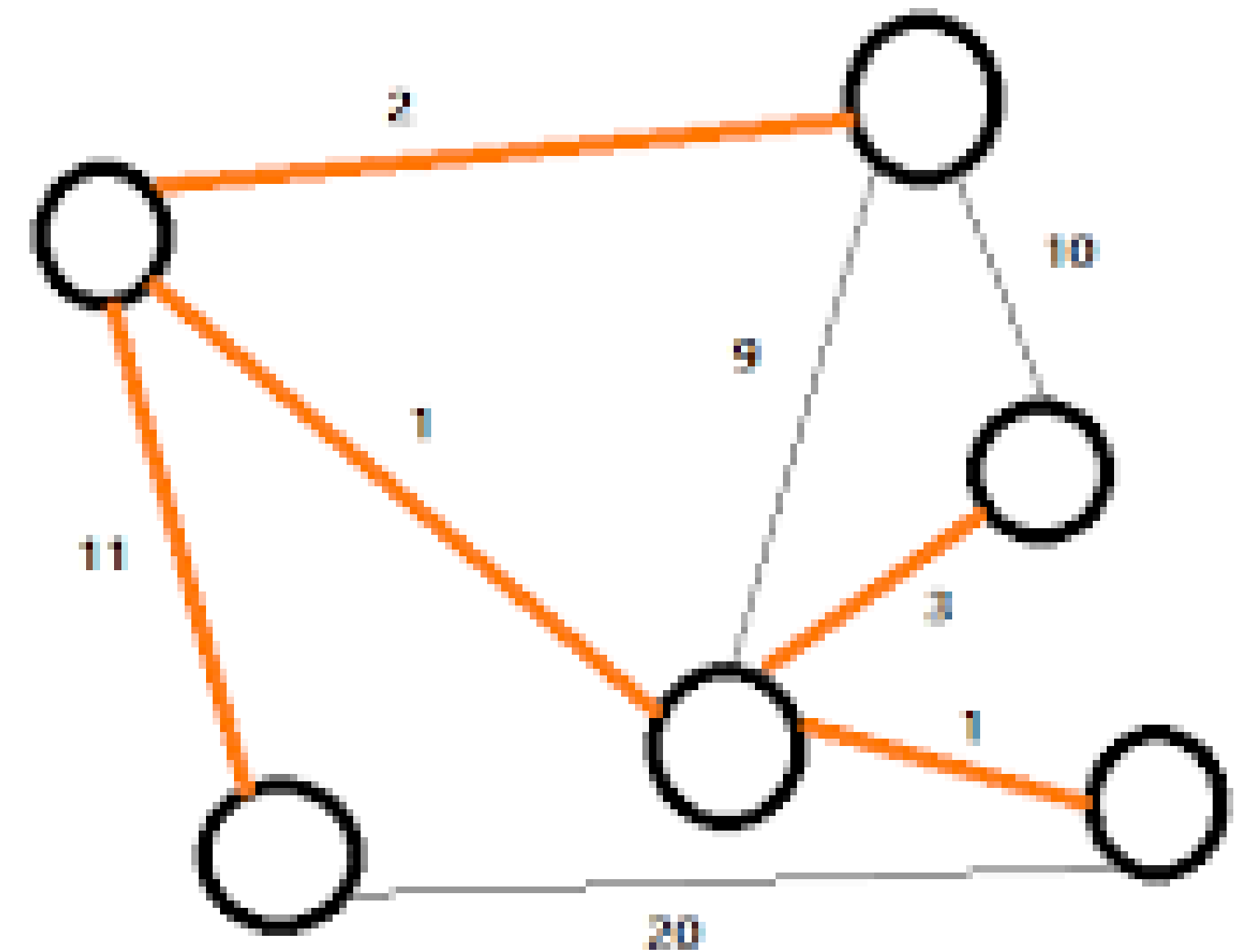


Spanning Tree

- Given an **undirected** graph, a **spanning tree** T is a subgraph of G , where T :
 - Is **connected**.
 - Is **acyclic**.
 - Includes **all** vertices.
- Tree
- Spanning

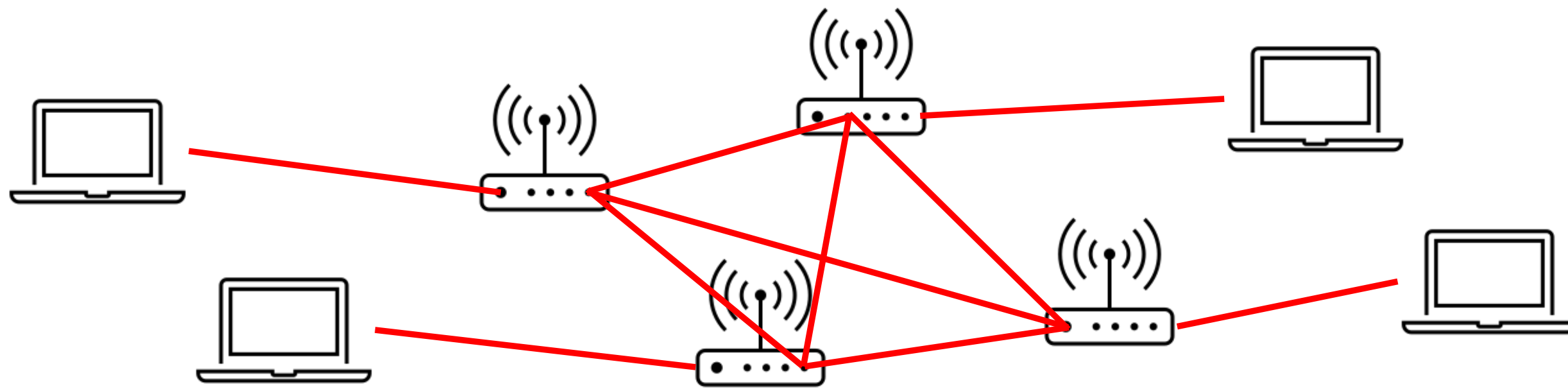
Example:

- Spanning tree is the nodes connected with orange edges

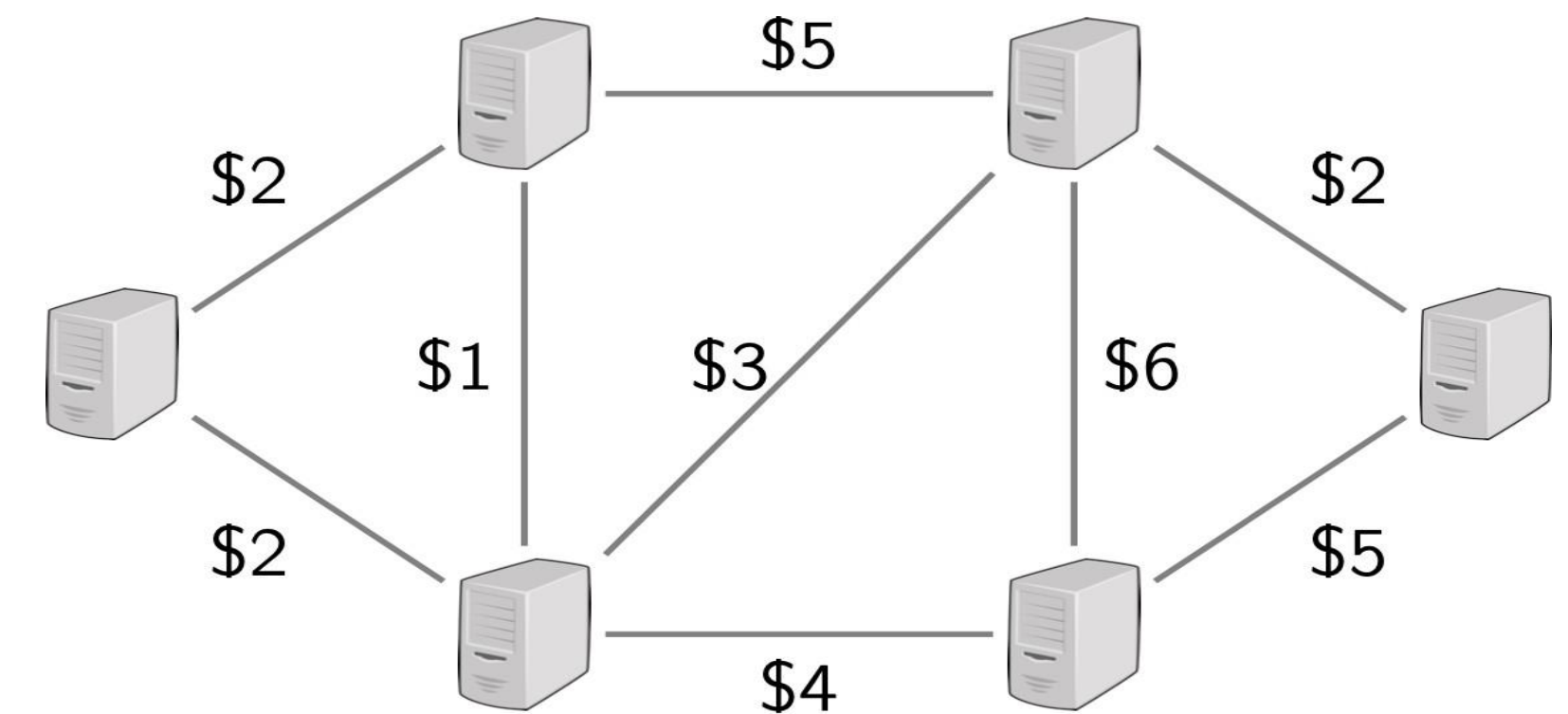


Applications

- A spanning tree connects **all nodes** with **as few edges as possible**



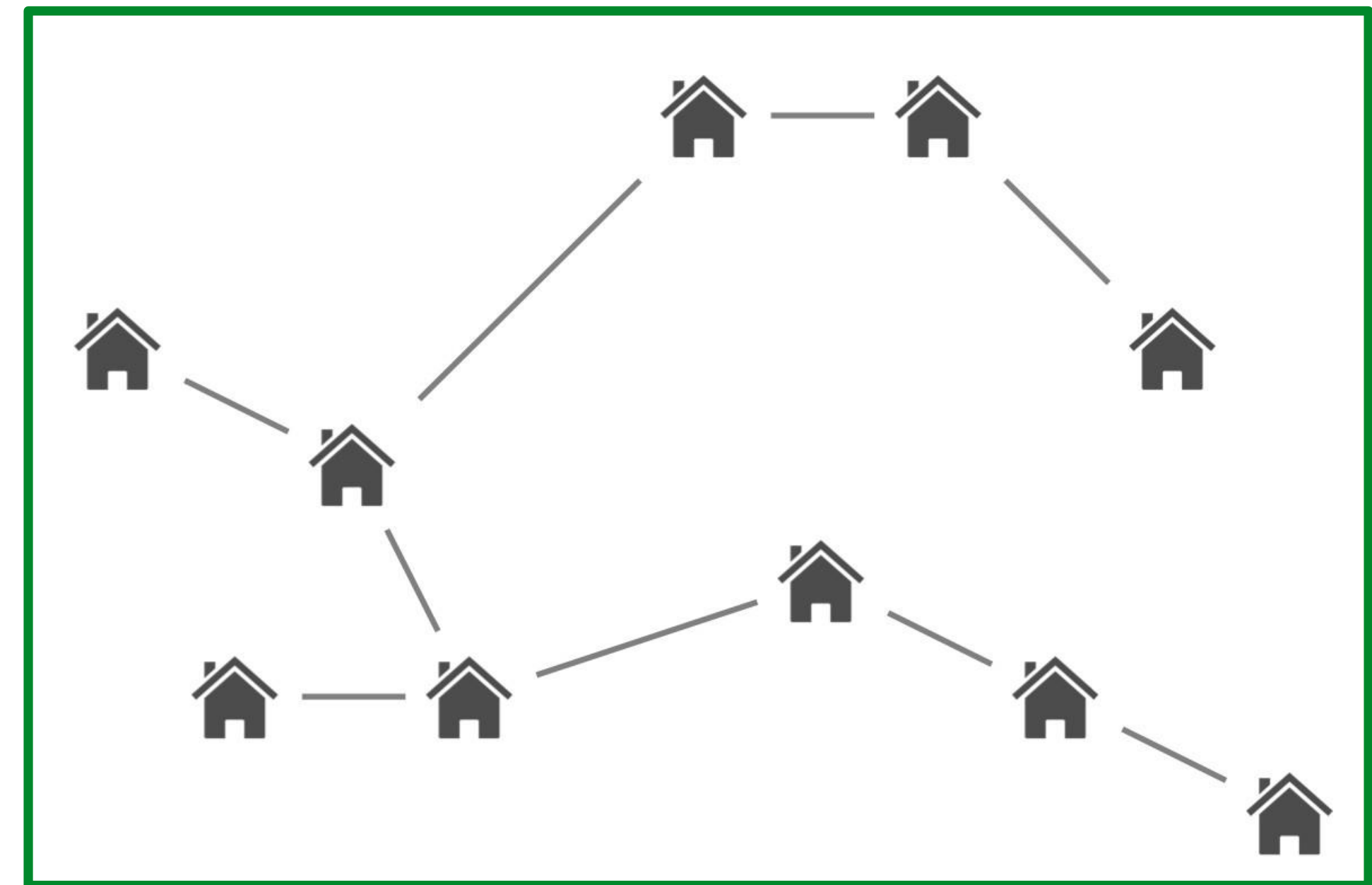
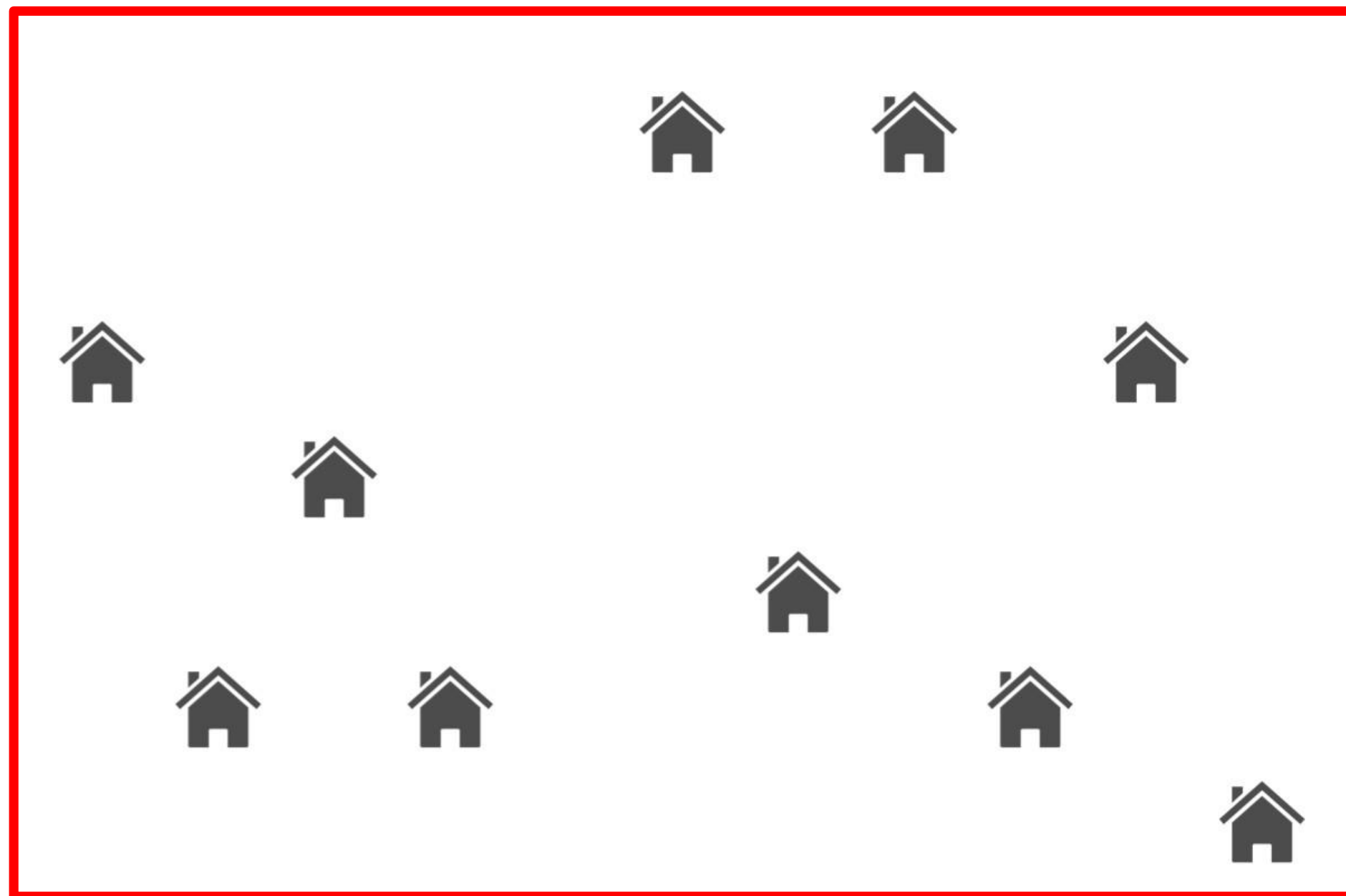
Ex-1: A local area network so everybody gets the message and no unnecessary messages get sent



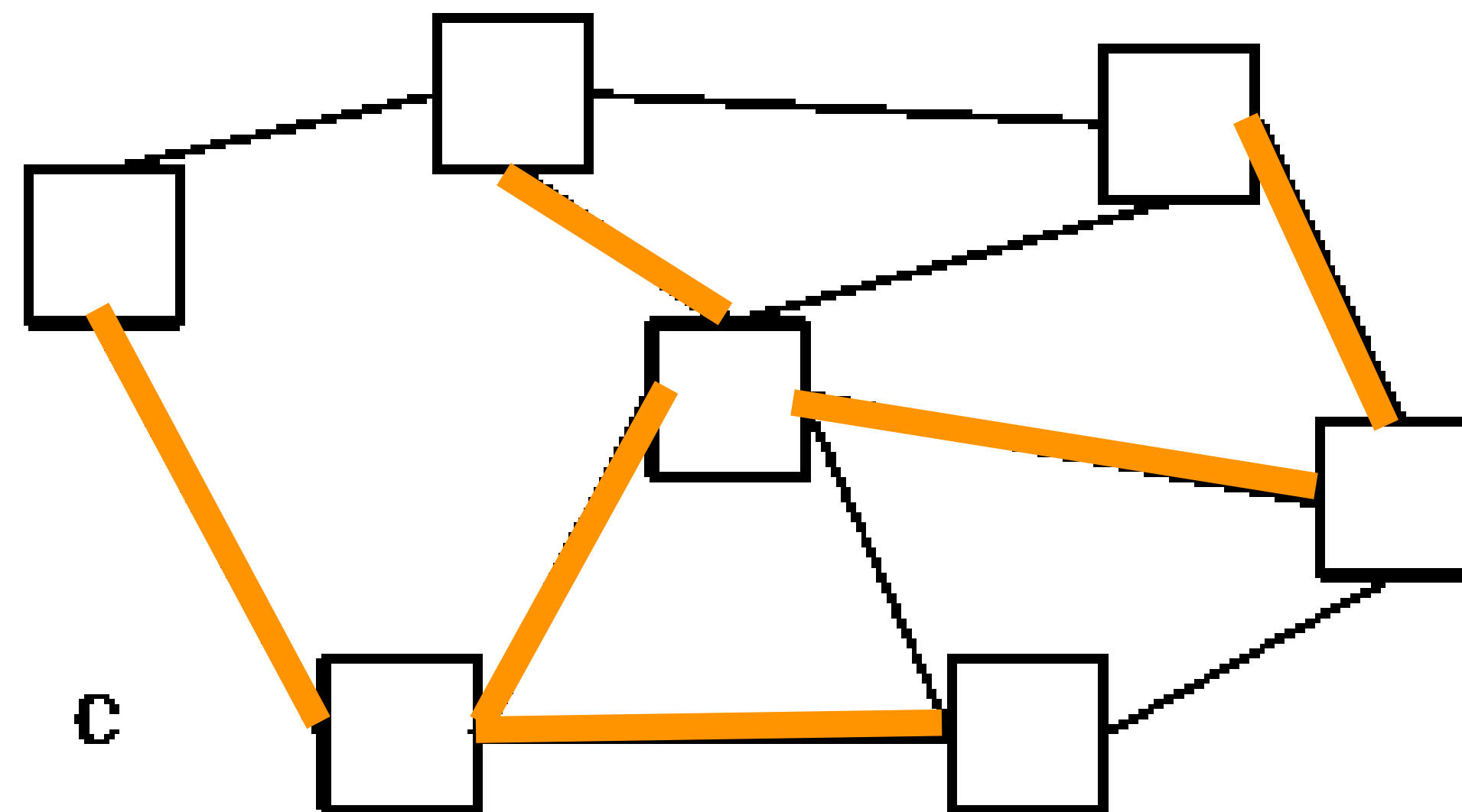
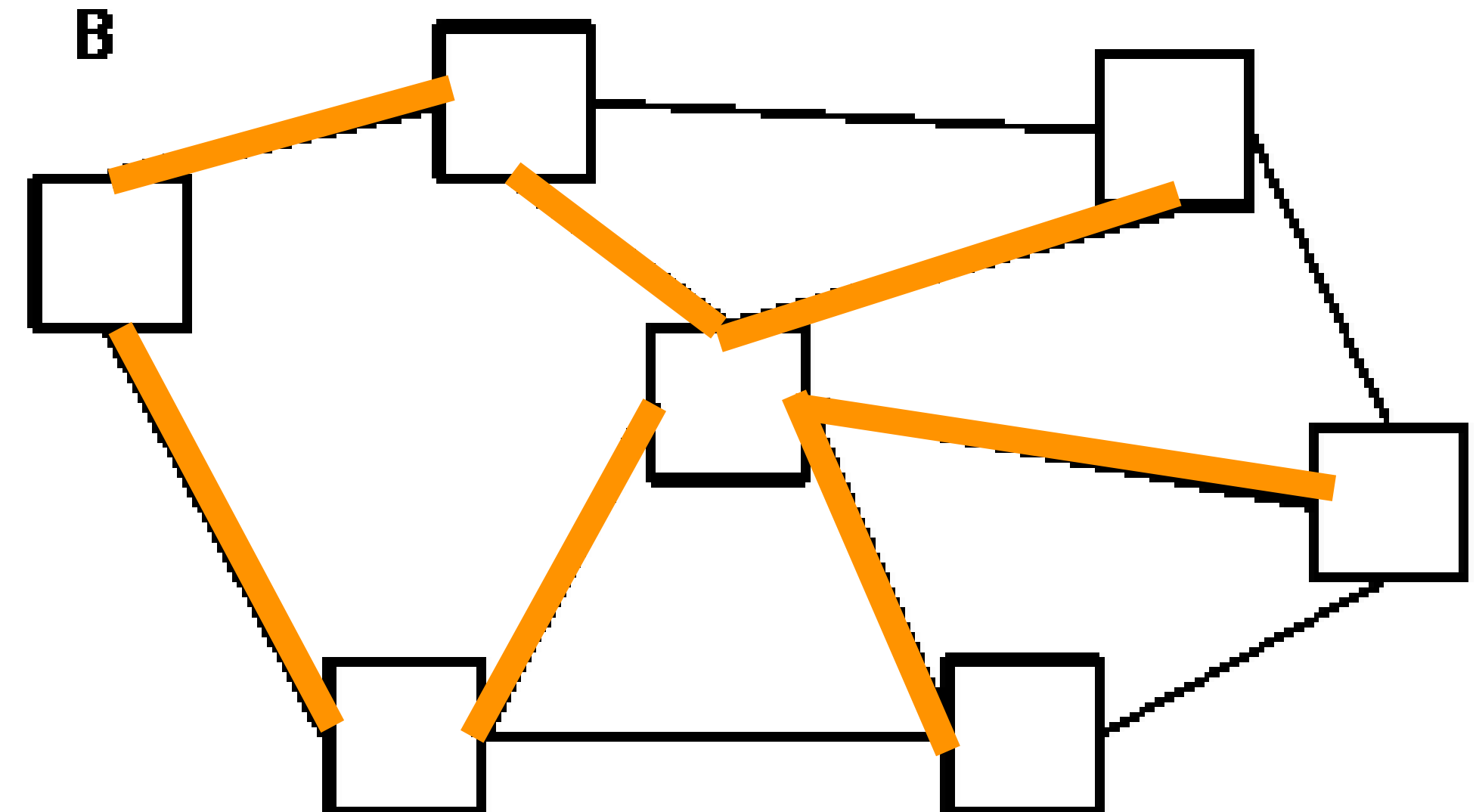
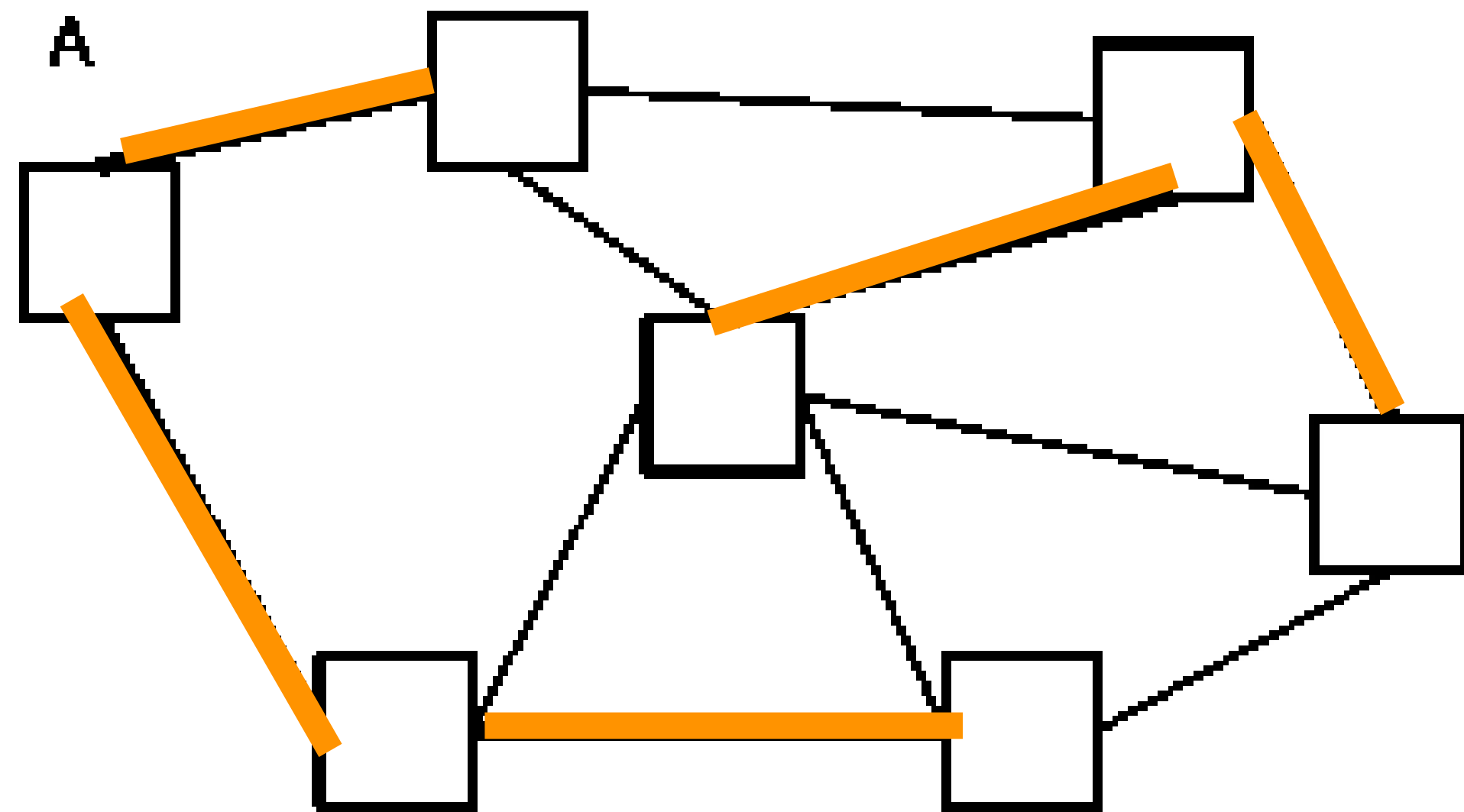
Ex-2: Connecting computers with wires

Applications (2/2)

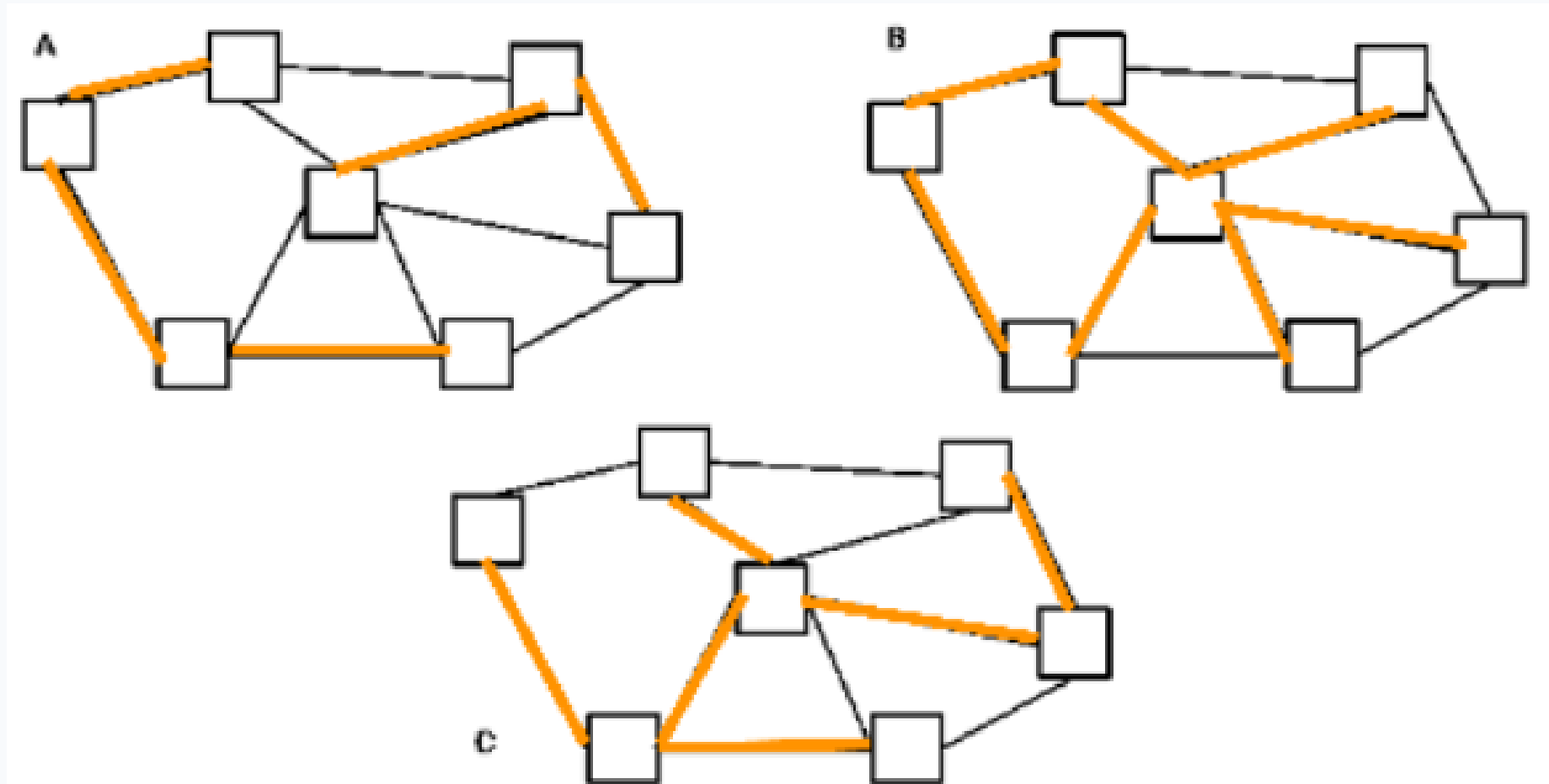
- **Ex-3:** Building roads
 - Other similar examples: electrical wiring for a house or wires on a chip



Which of the following are Spanning Trees?



Which of the following is/are not a spanning tree?



A

0%

B

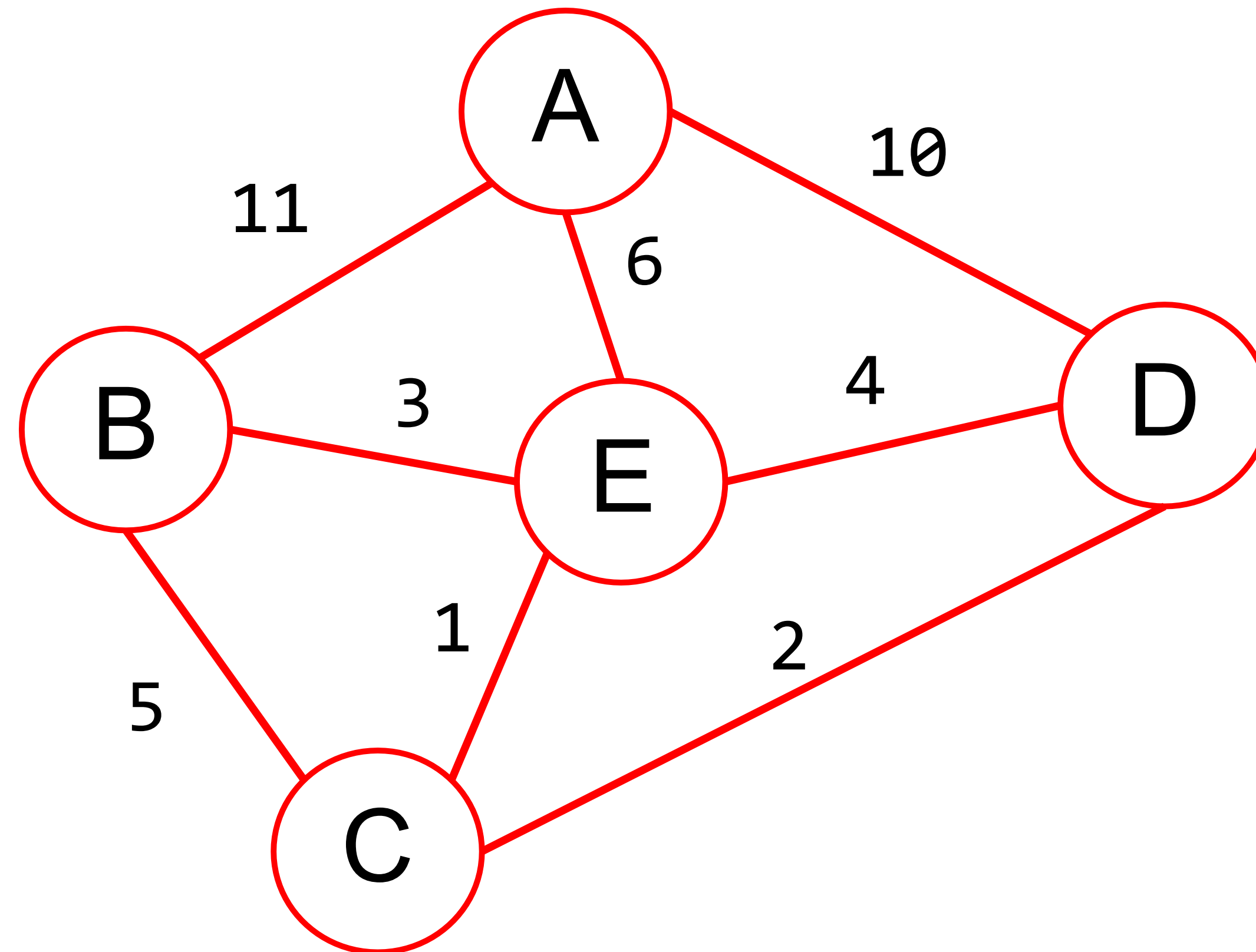
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C

0%

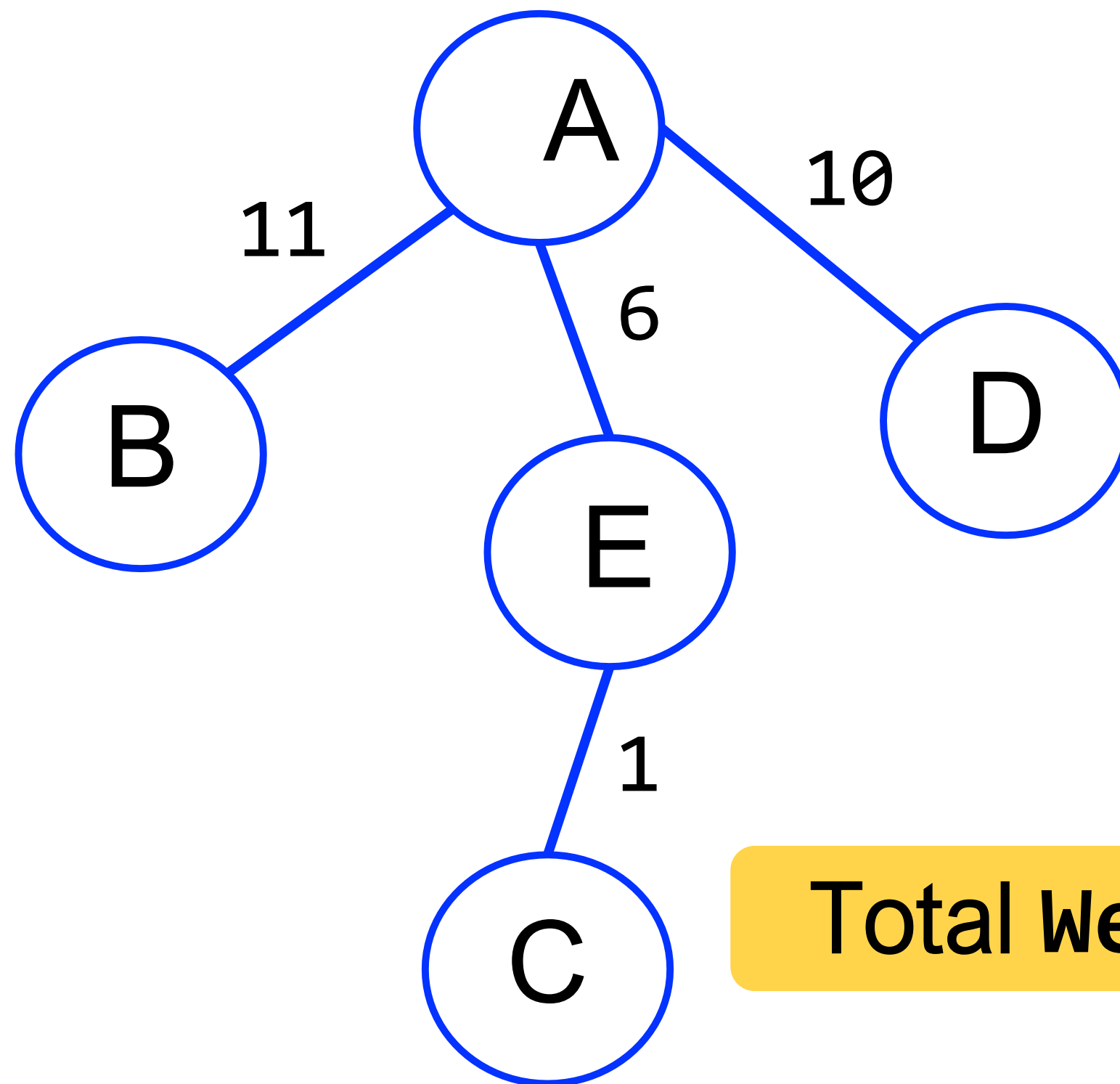
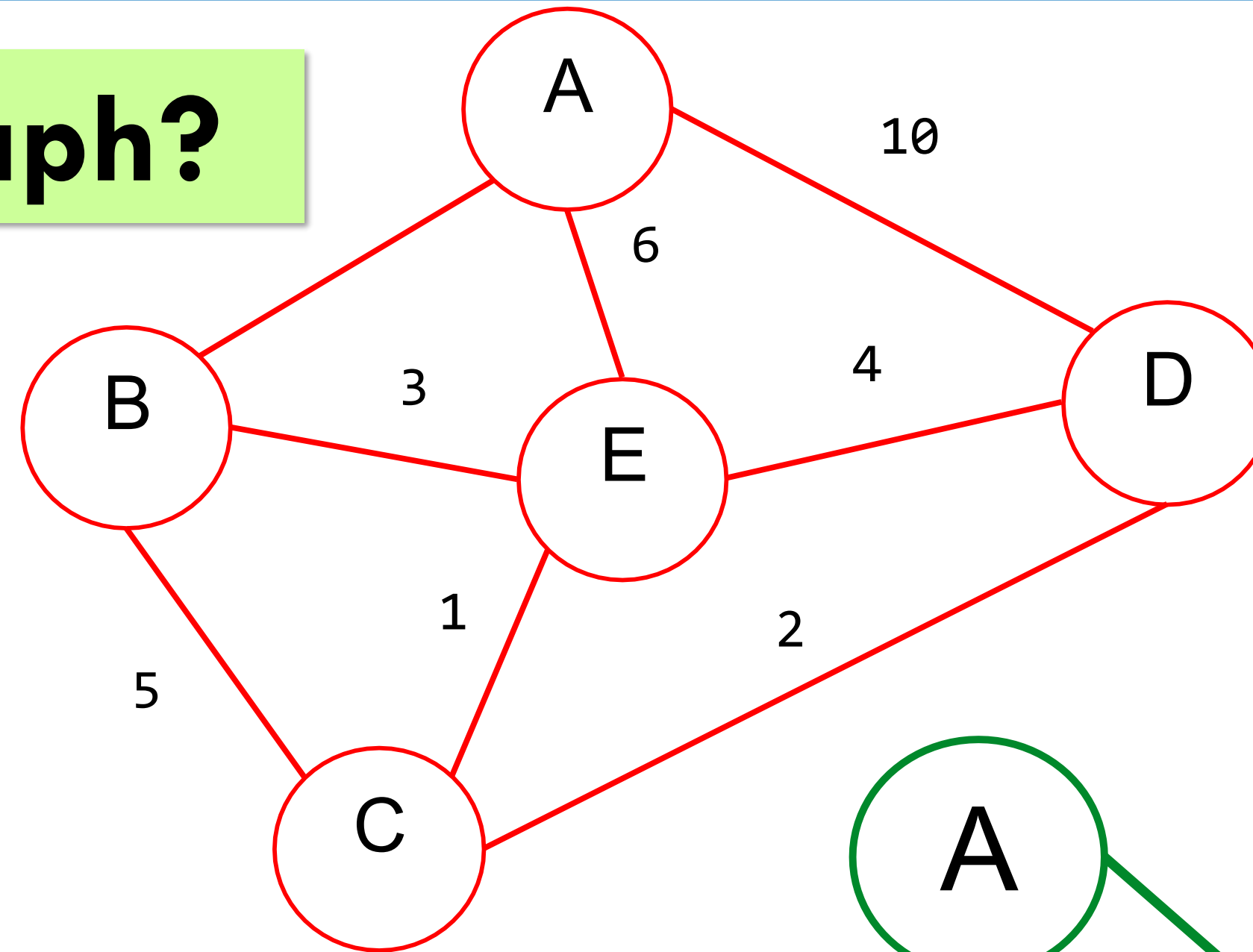
Finding Minimum Spanning Trees (MSTs)

- Suppose we are given a **weighted graph** $G=(V,E)$. We would like to find a **tree of G** with **minimum total weight** of edges

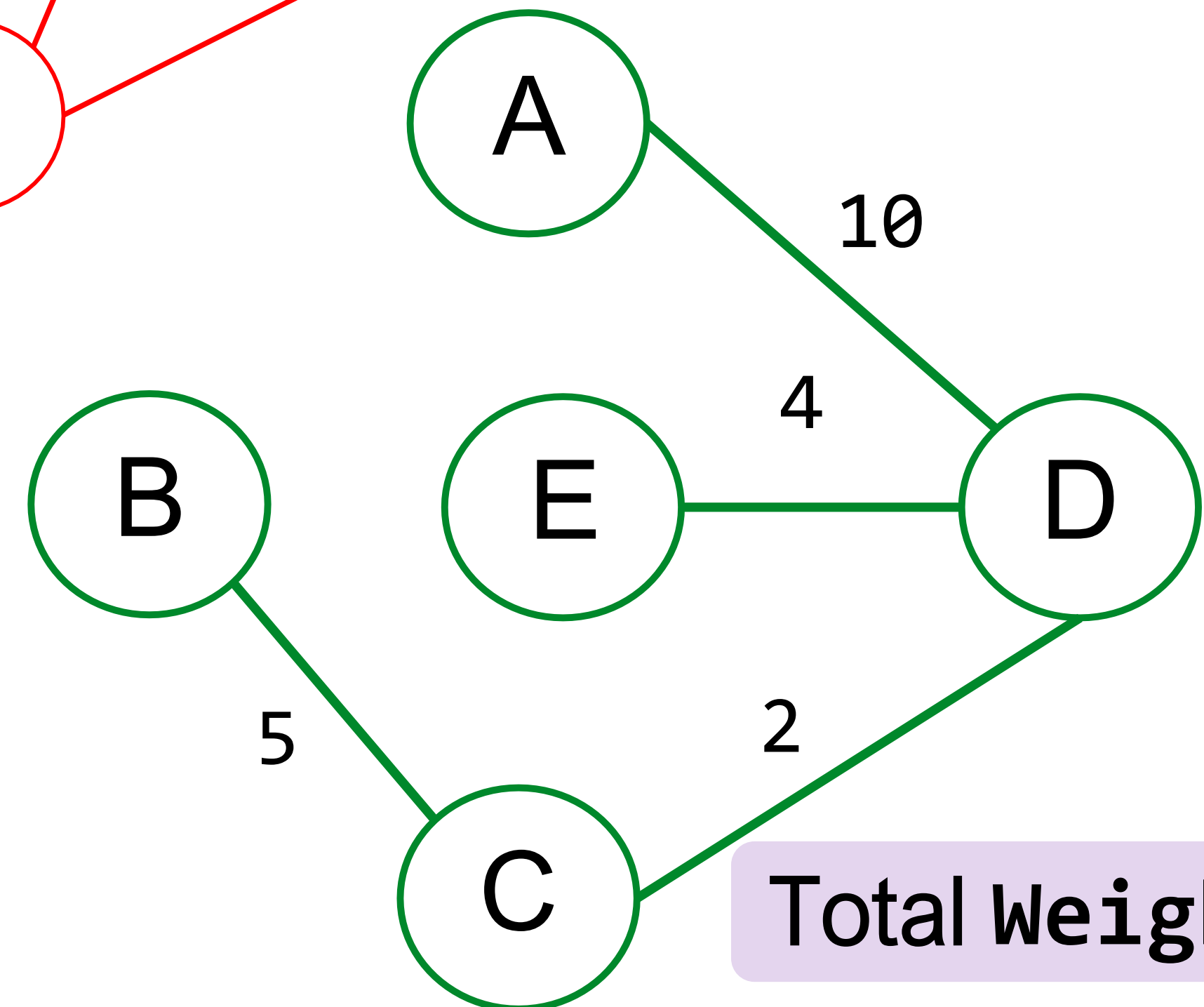


Minimum Spanning Trees (MSTs)

What is the *MST* for this graph?

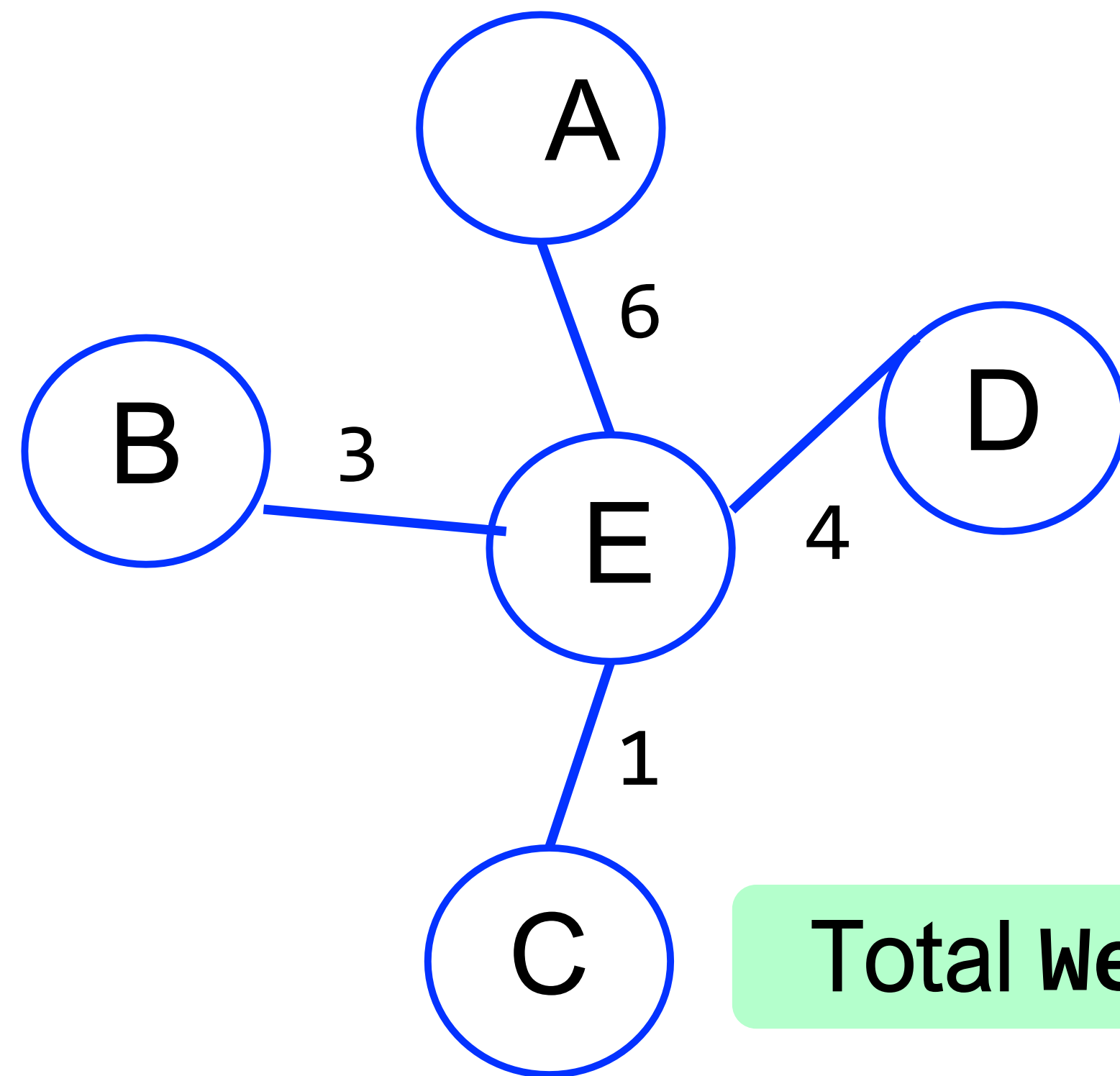
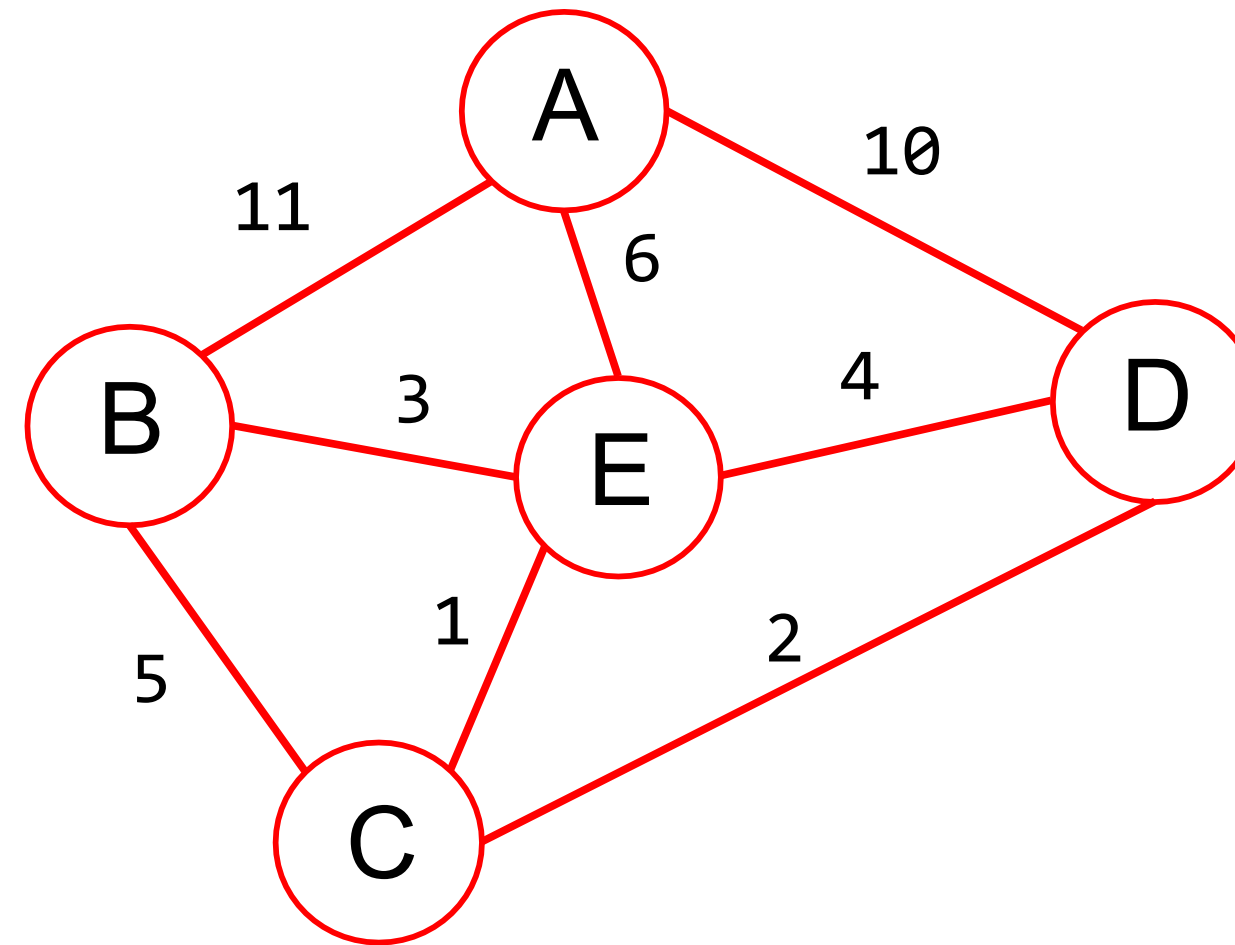


Total Weight = 28

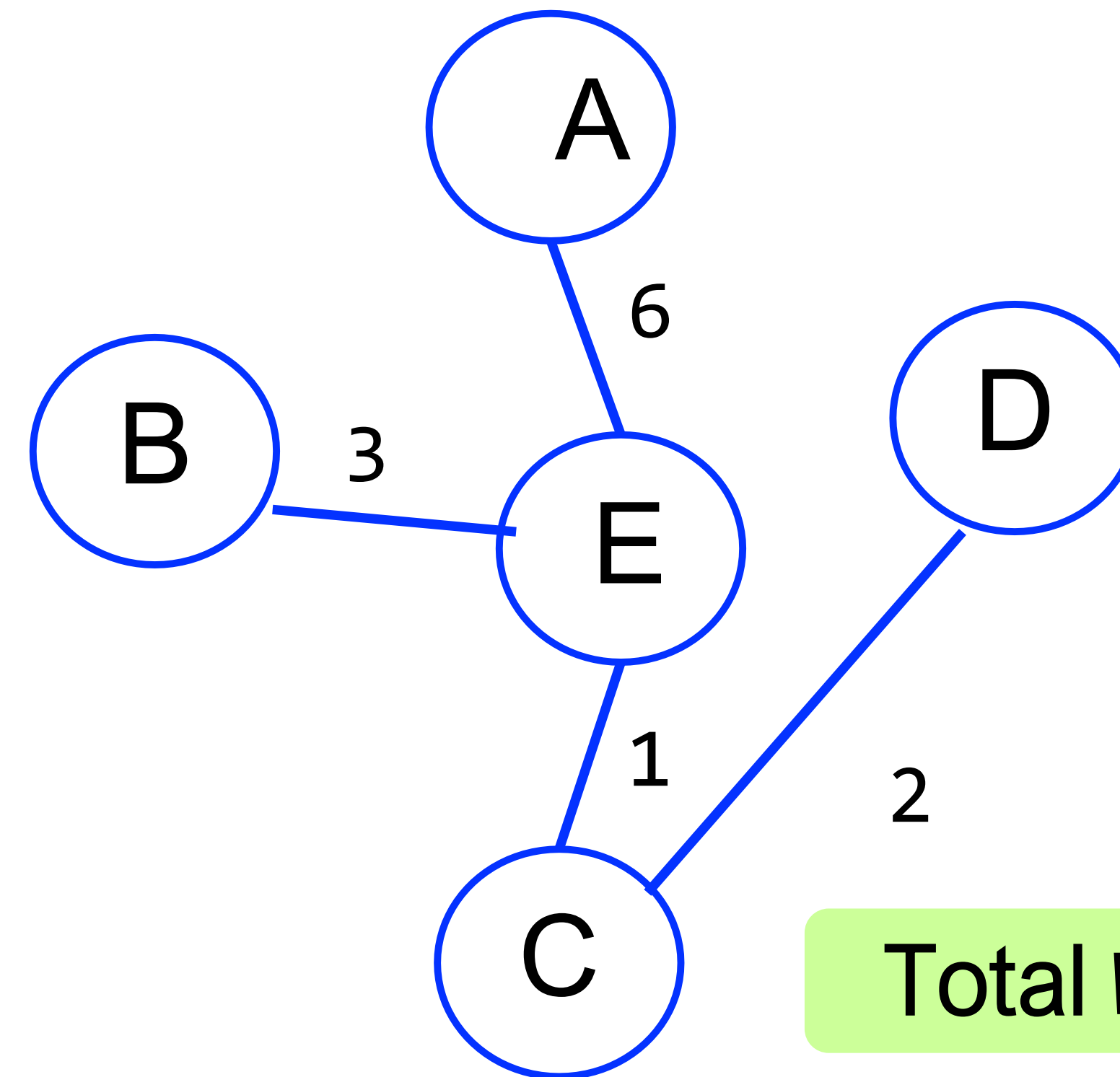


Total Weight = 21

Minimum Spanning Trees (MSTs)

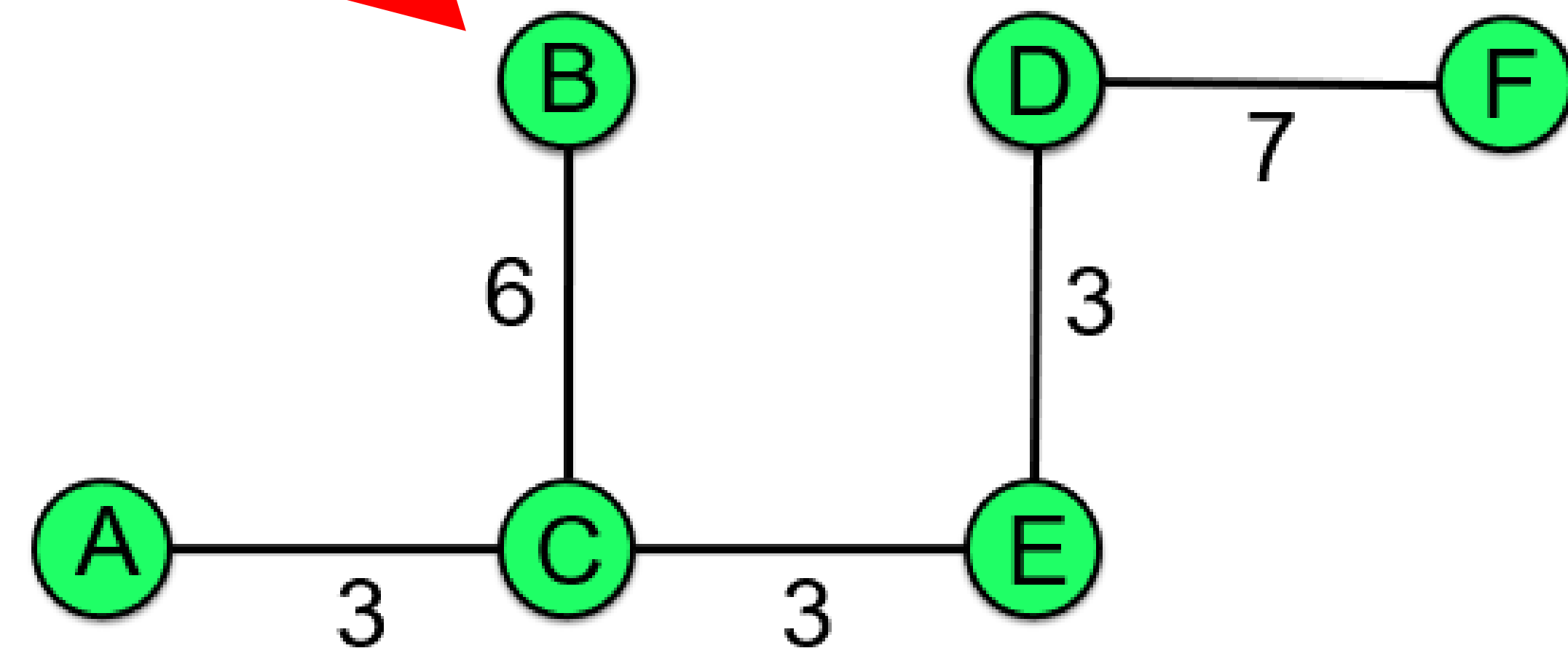
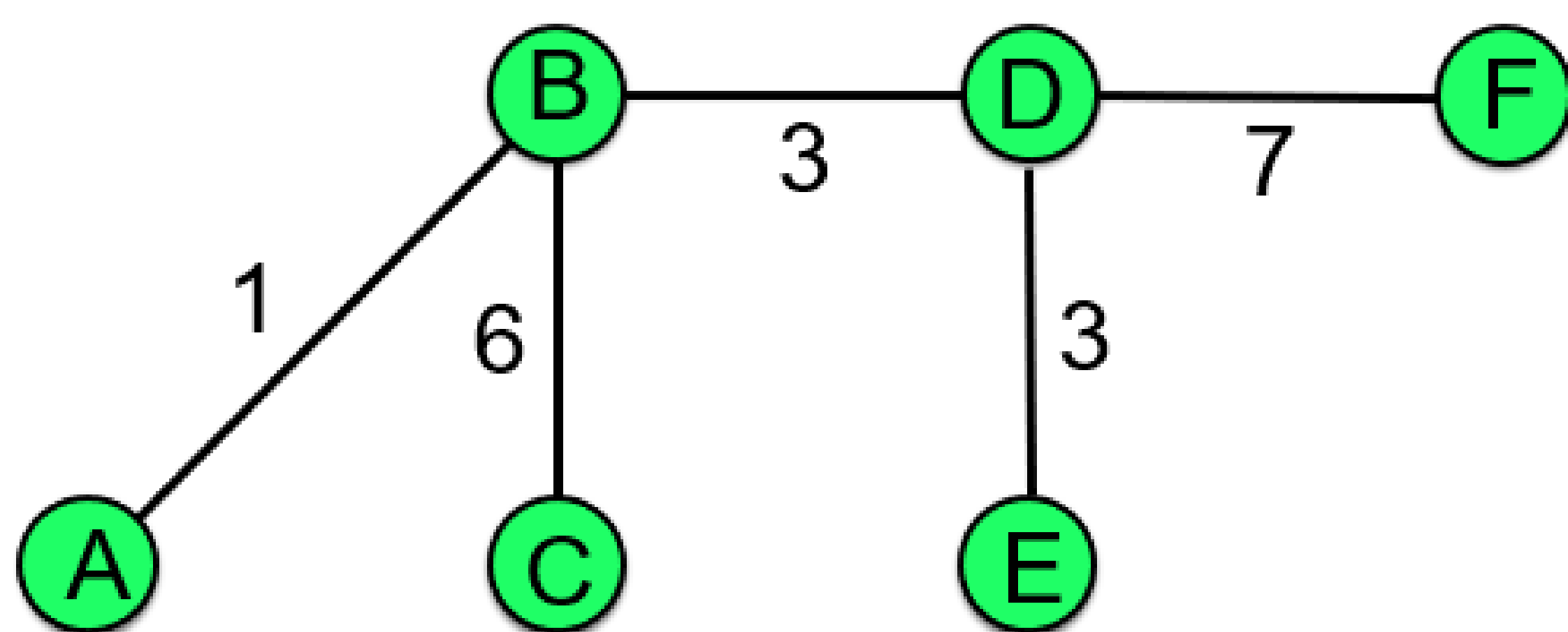
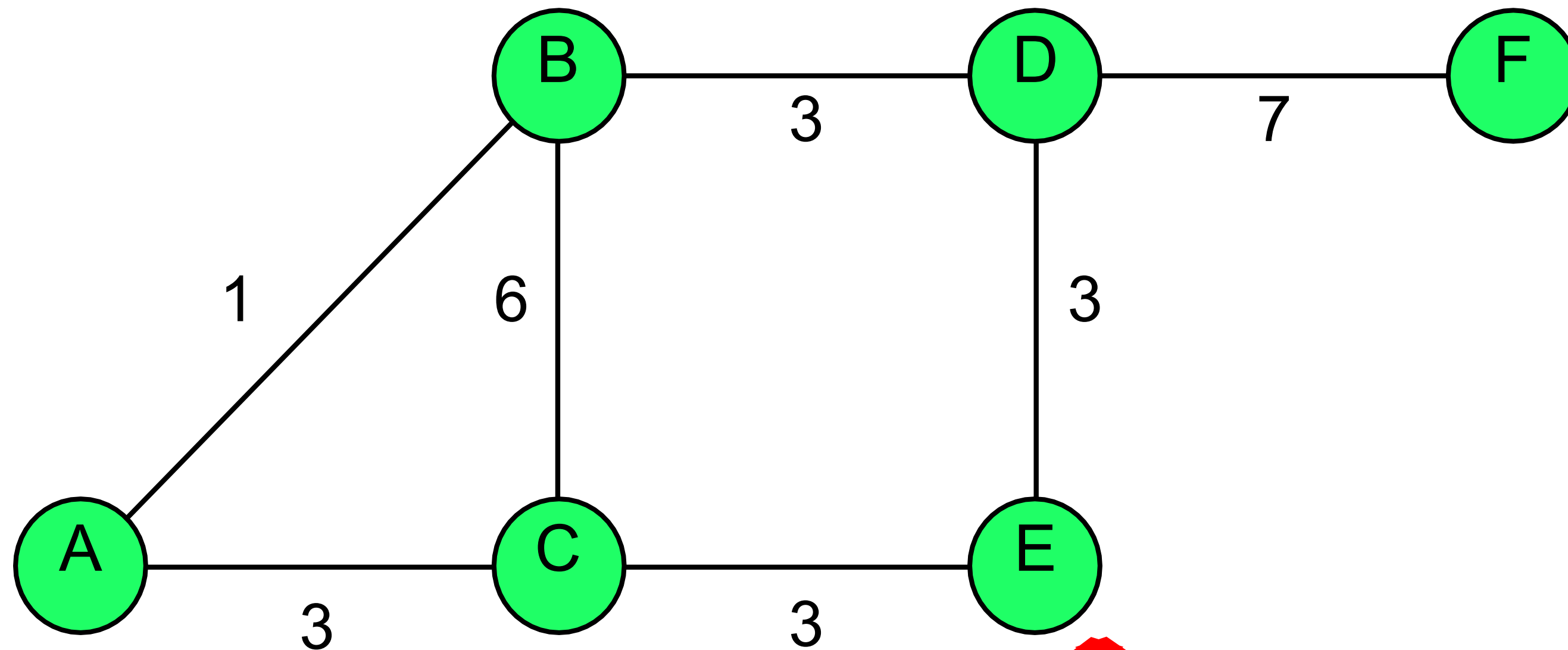


Total Weight = 14

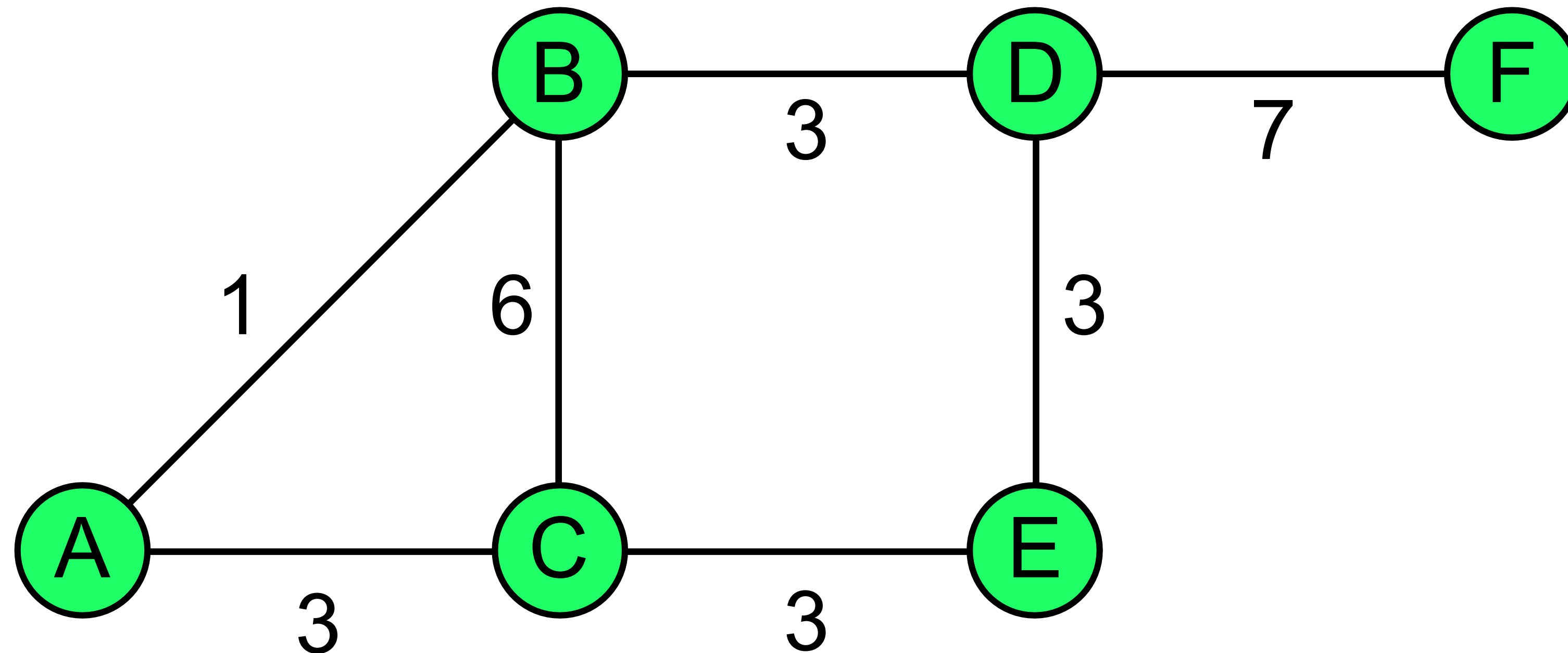


Total Weight = 12

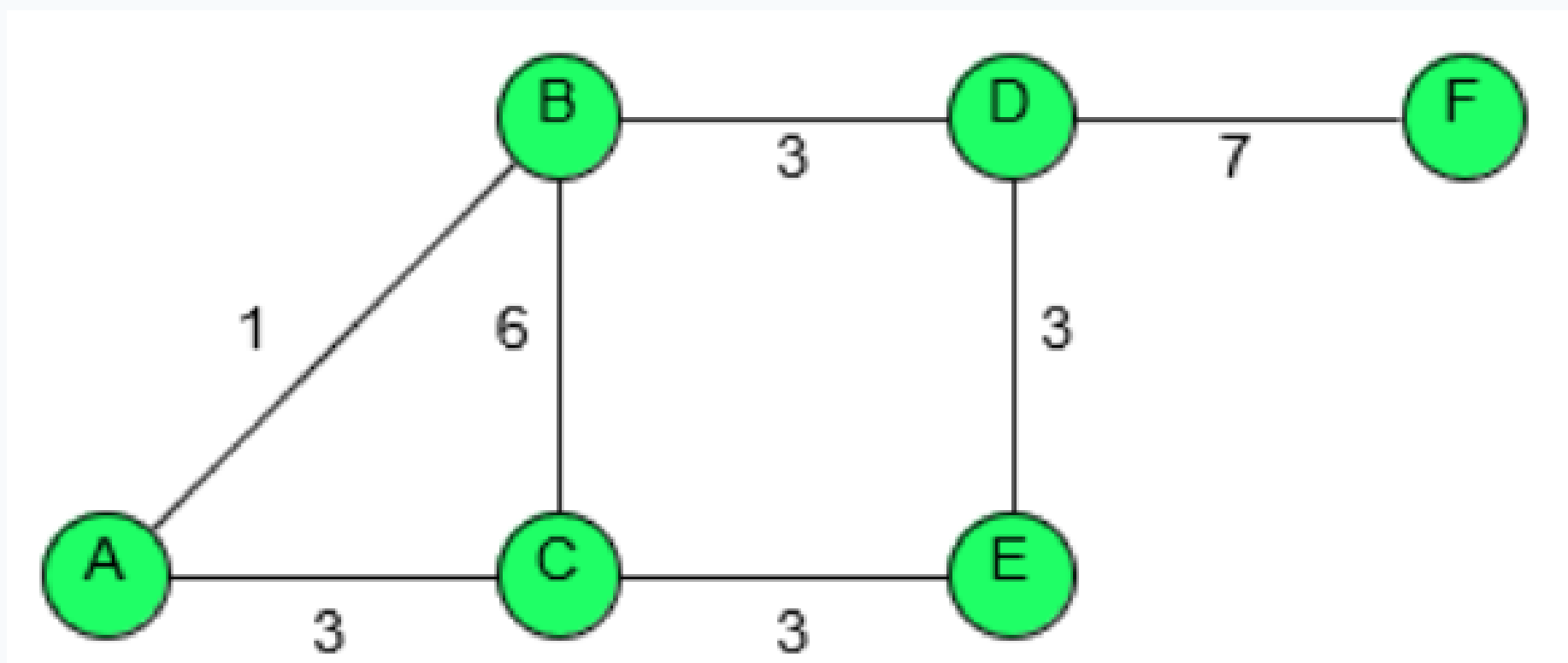
Multiple **distinct spanning tree** in a graph



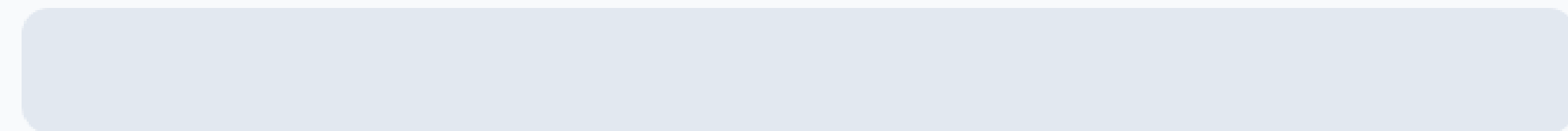
How many **distinct MSTs** are in this graph?



How many distinct MSTs are in the following graph?

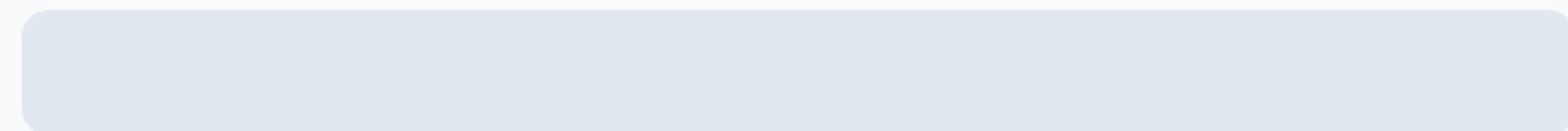


0-1



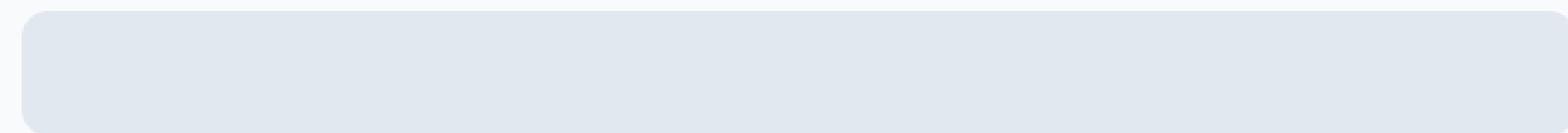
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2-3



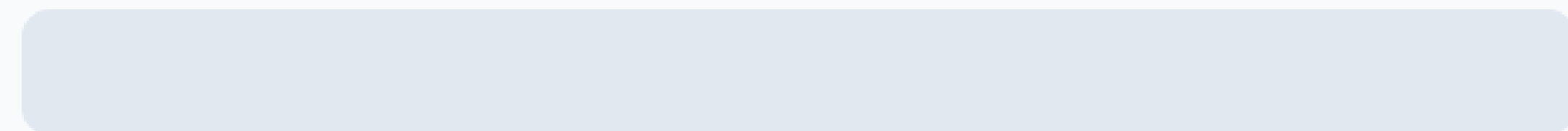
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4-5



0%

> 5



0%

Let's Discuss!

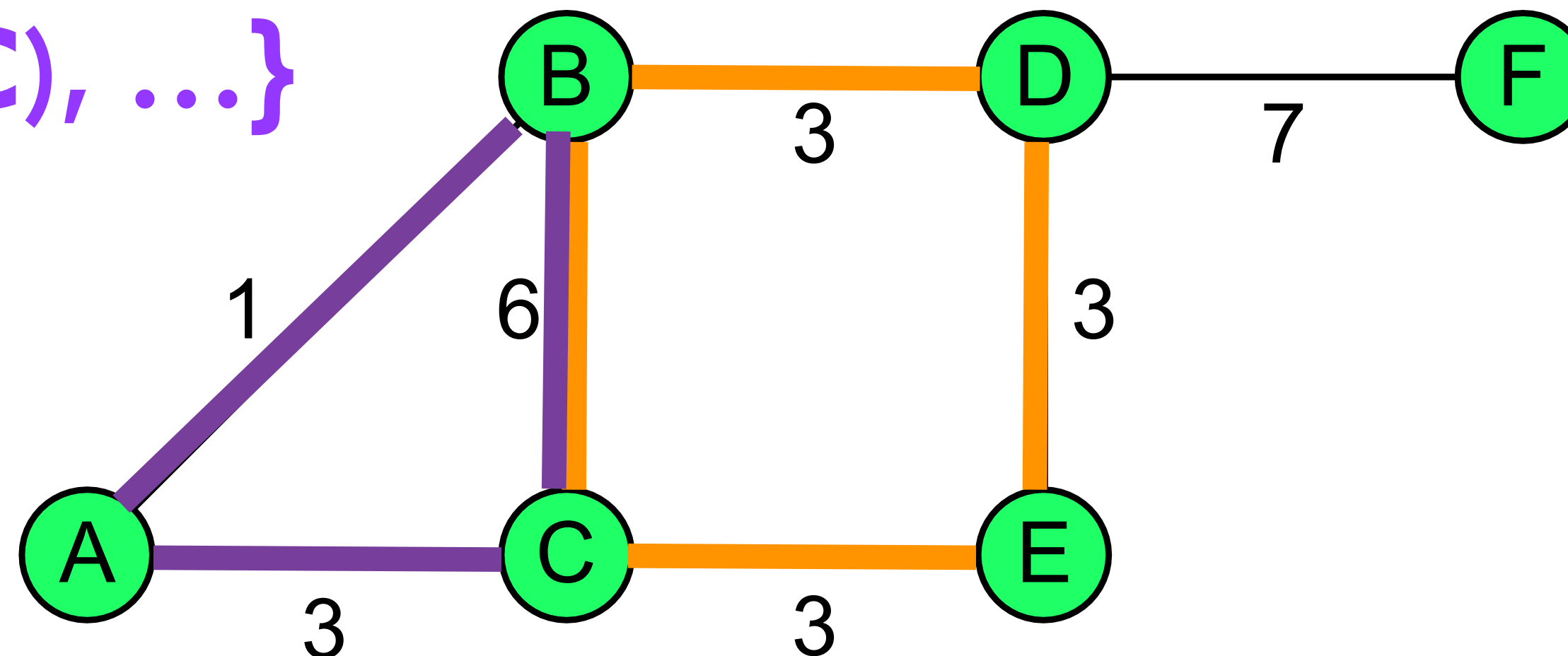
- There are three cycles in this graph:

1. {A, B, C}

2. {B, C, D, E}

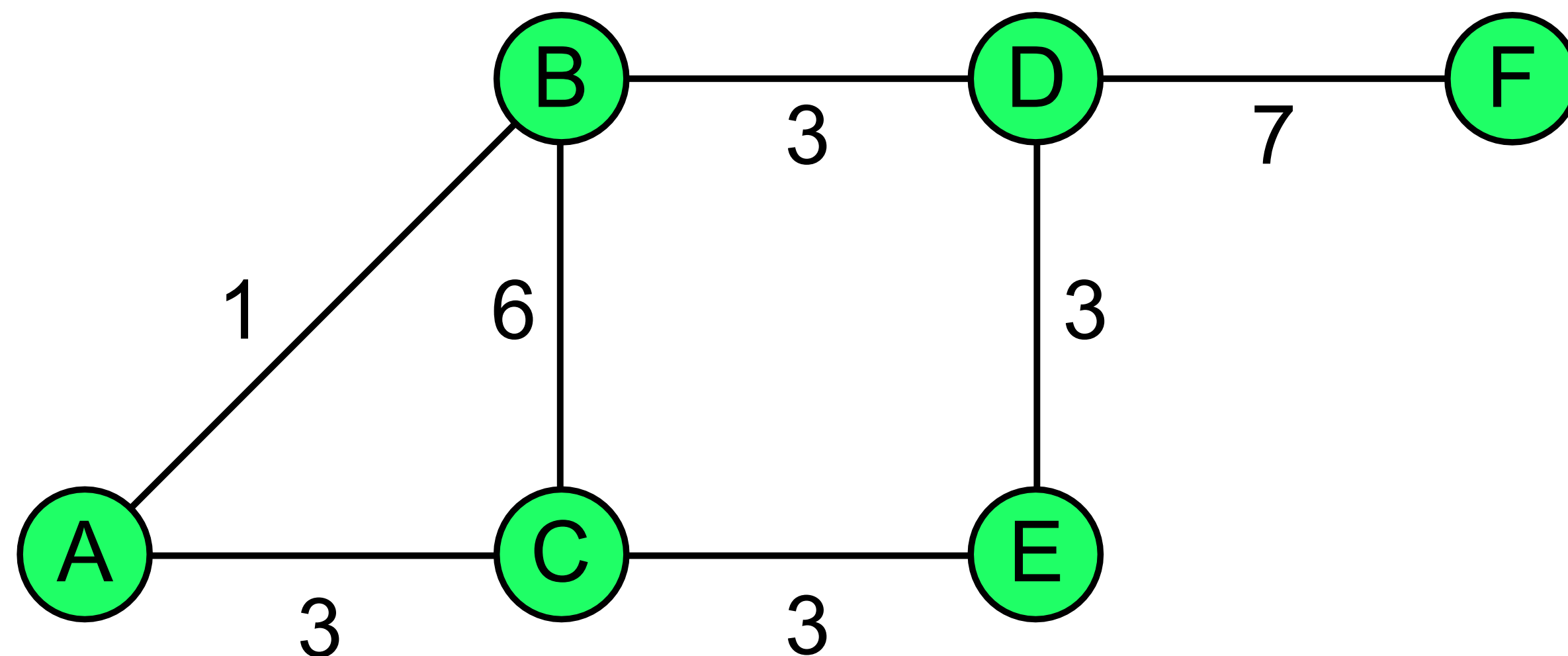
3. {A, B, D, E, C}

shared edges = {(B,C), ...}



Let's Discuss

- There are edges with the same weight!
- In any MST, 6 won't be there!
- We are now left with 4 edges with weight 3, removing one will give us a MST!
- Thus, there are 4 distinct MSTs



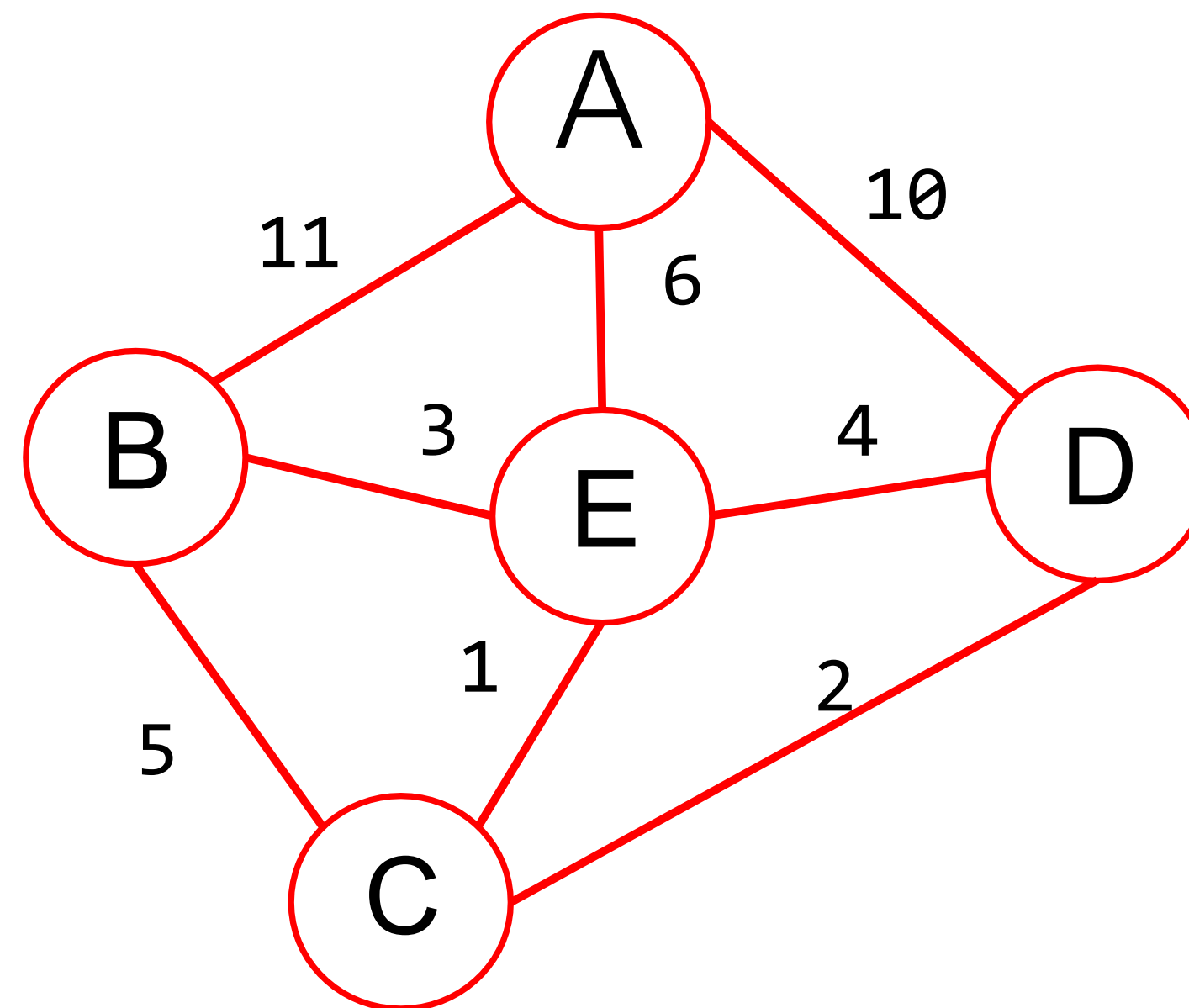
Key Observations

- Are MSTs unique for the graph?
 - ... unless original graph was already a tree
- Can we find MST in disconnected graph?
- Edges in MST?
 - A tree with $|V|$ nodes has $|V|-1$ edges
 - So, every solution to the spanning tree problem has $|V|-1$ edges

So, how can we find the *MST* of a graph?

Problem: How to Find MST of a Graph?

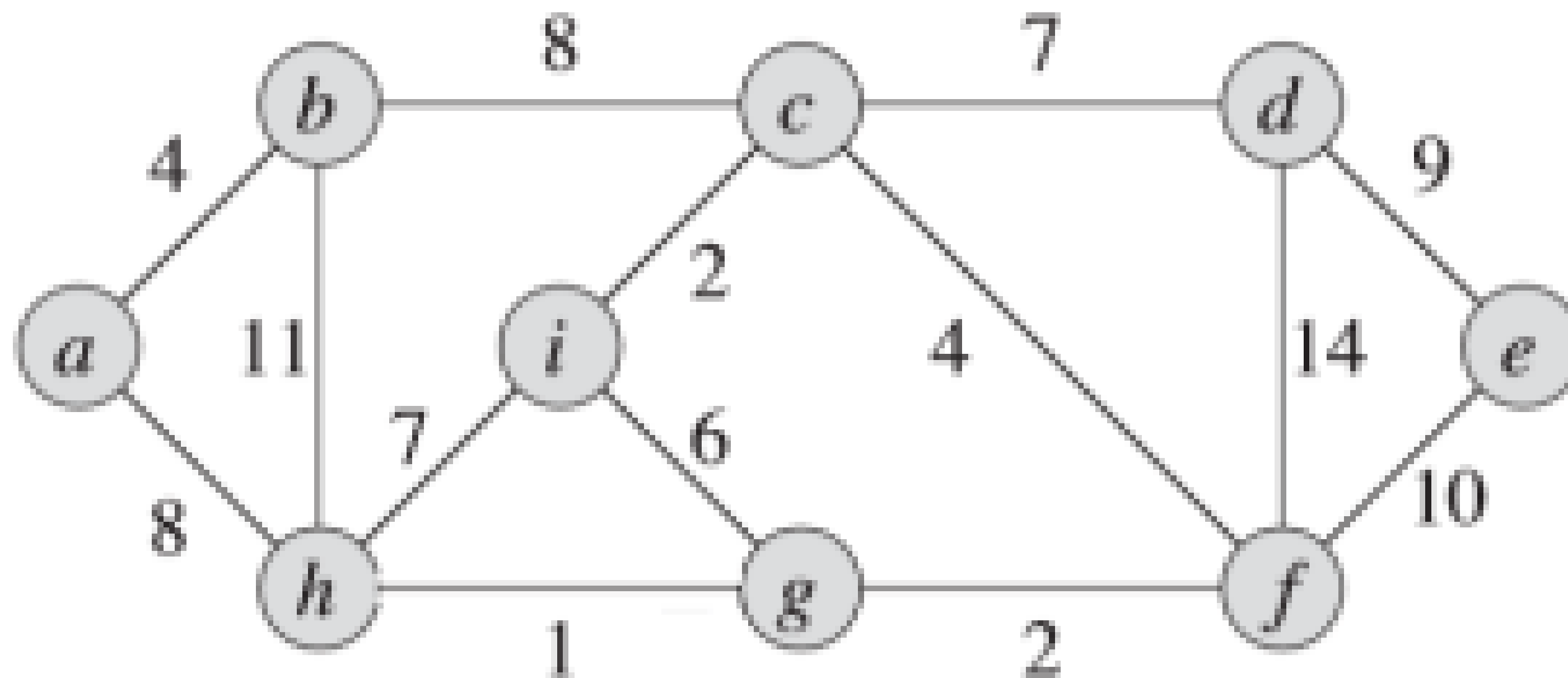
- Let $G=(V,E)$ be an undirected graph
- $T=(V,F)$ of G is a graph with the same vertices as G and $|V| - 1$ edges that form a tree (Spanning Tree)
- If G is not connected, T is a Forest (or collection of trees)



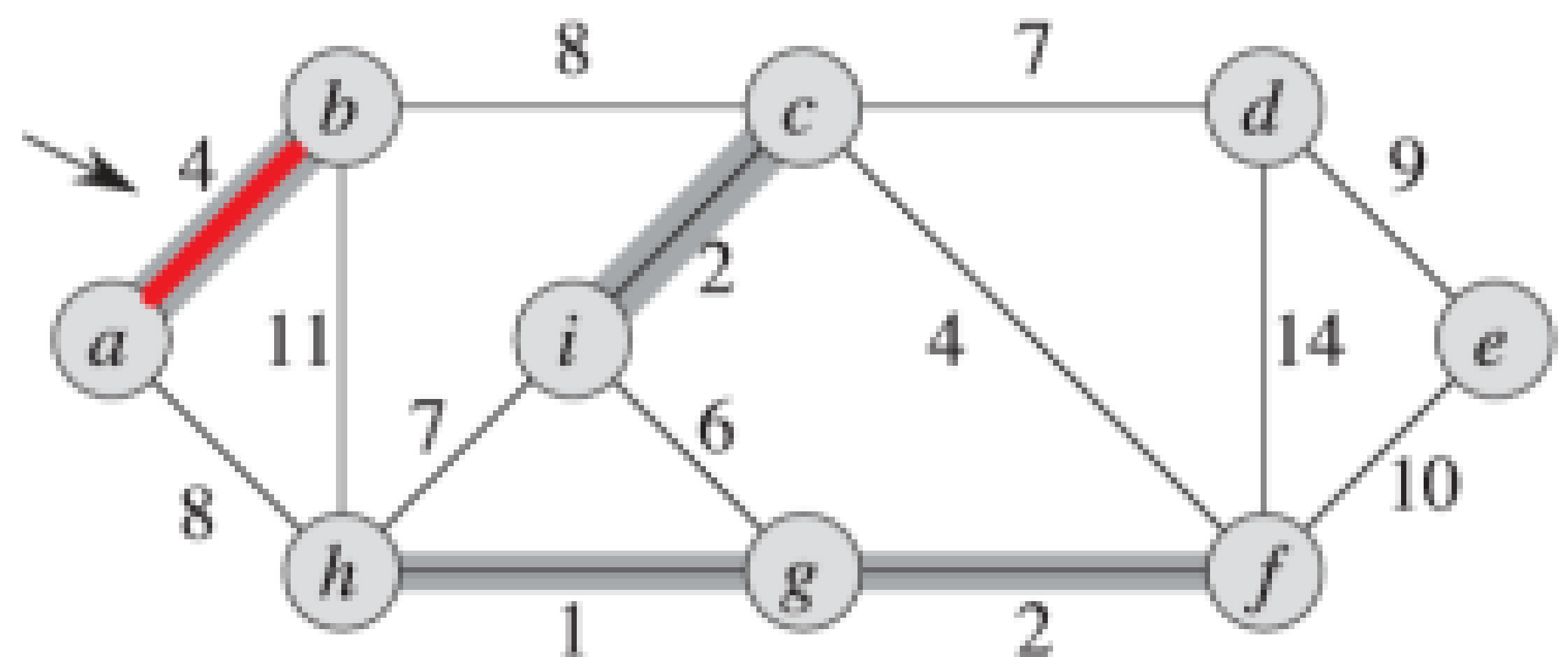
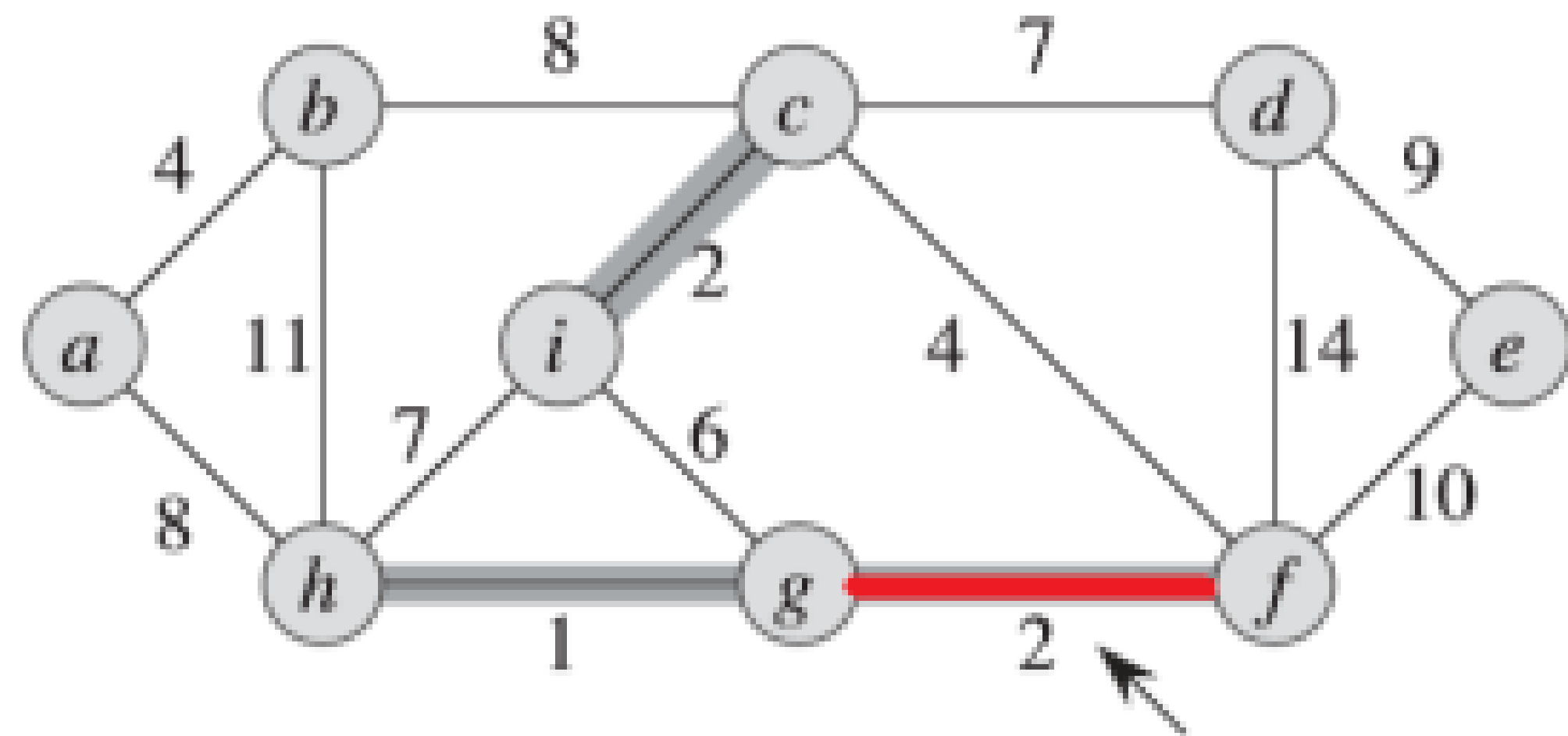
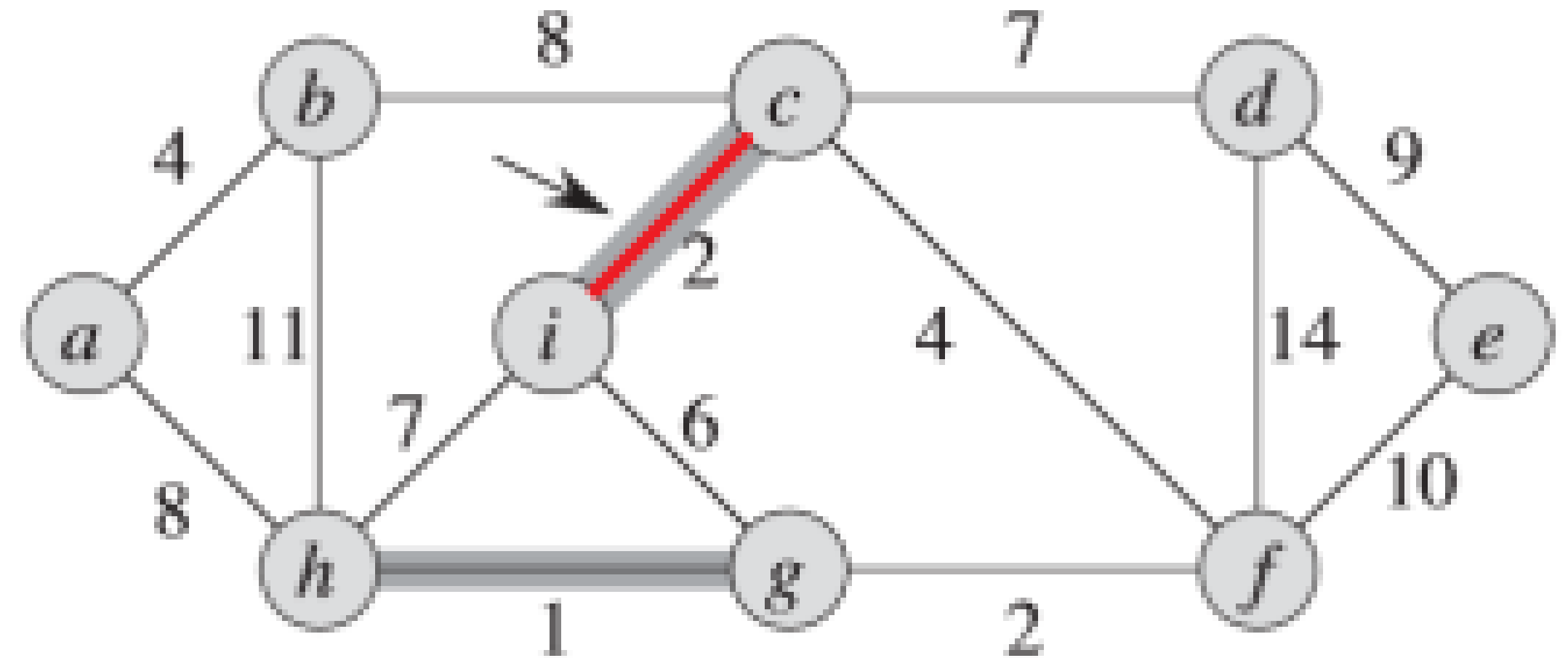
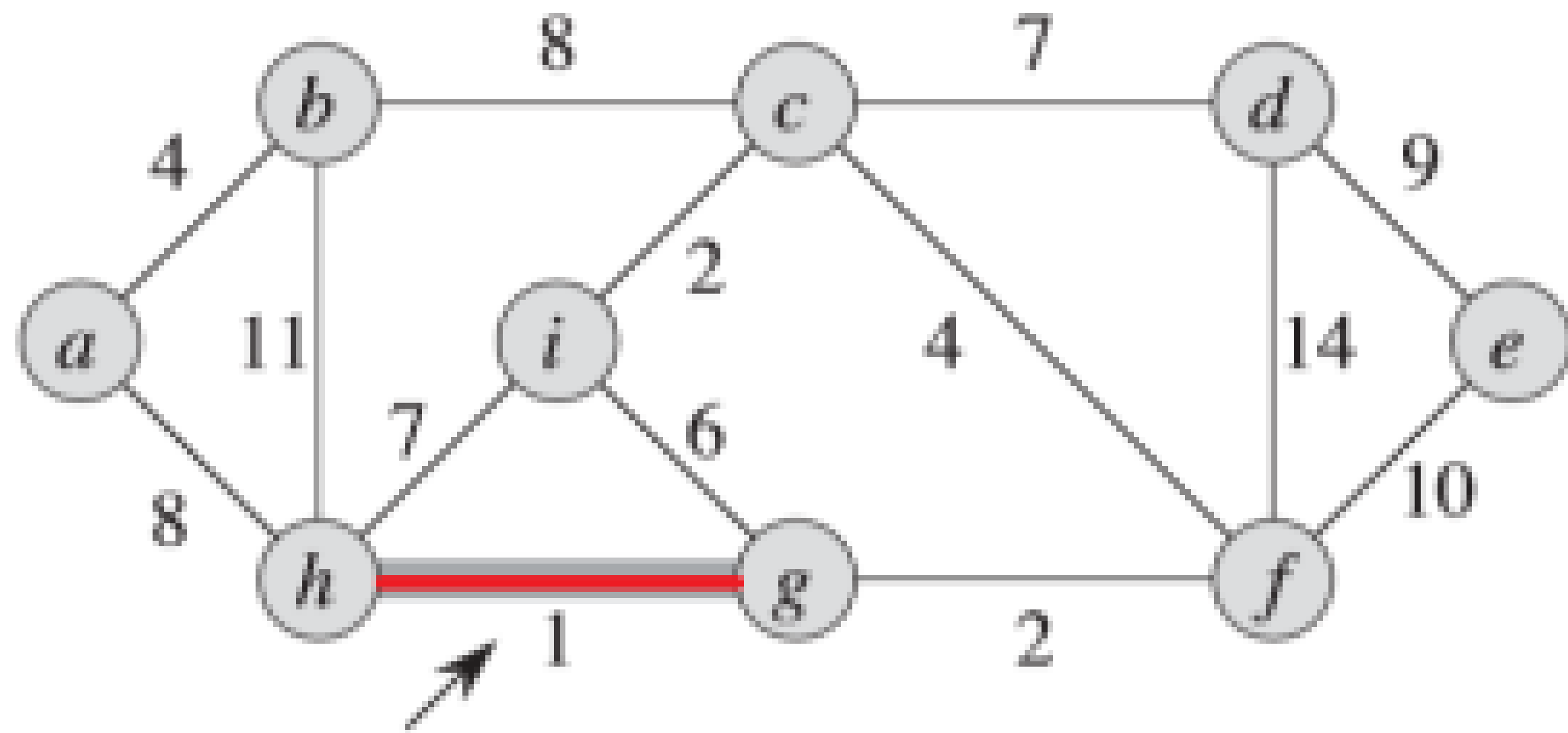
Kruskal's Algorithm

- (1) Create a new graph T with same vertices as G but no edges yet
- (2) Make a list of all edges in G
- (3) Sort edges by weight (lowest to highest)
- (4) Loop through edges in sorted order
 - For each edge (u,w)
 - if u & w are not connected by a path then we connect them, i.e., add (u,w) to T

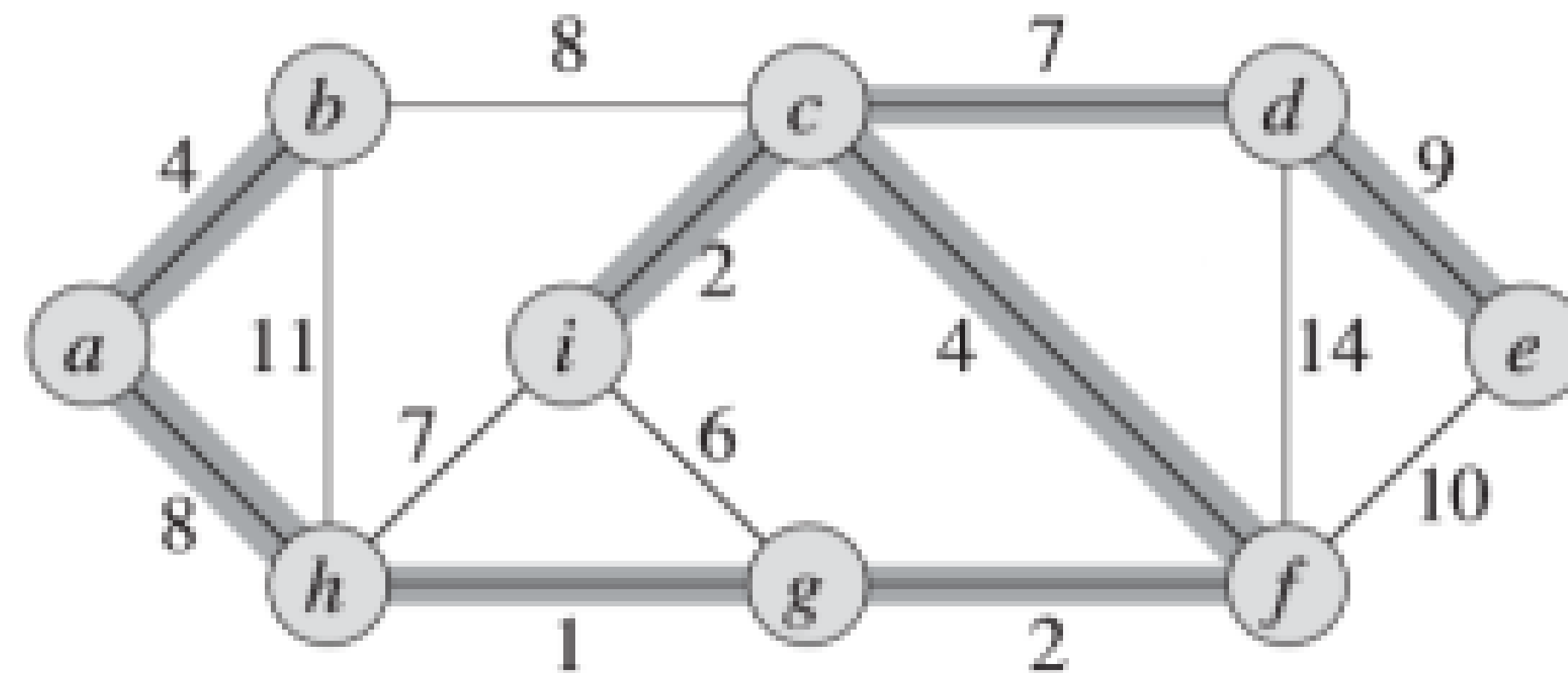
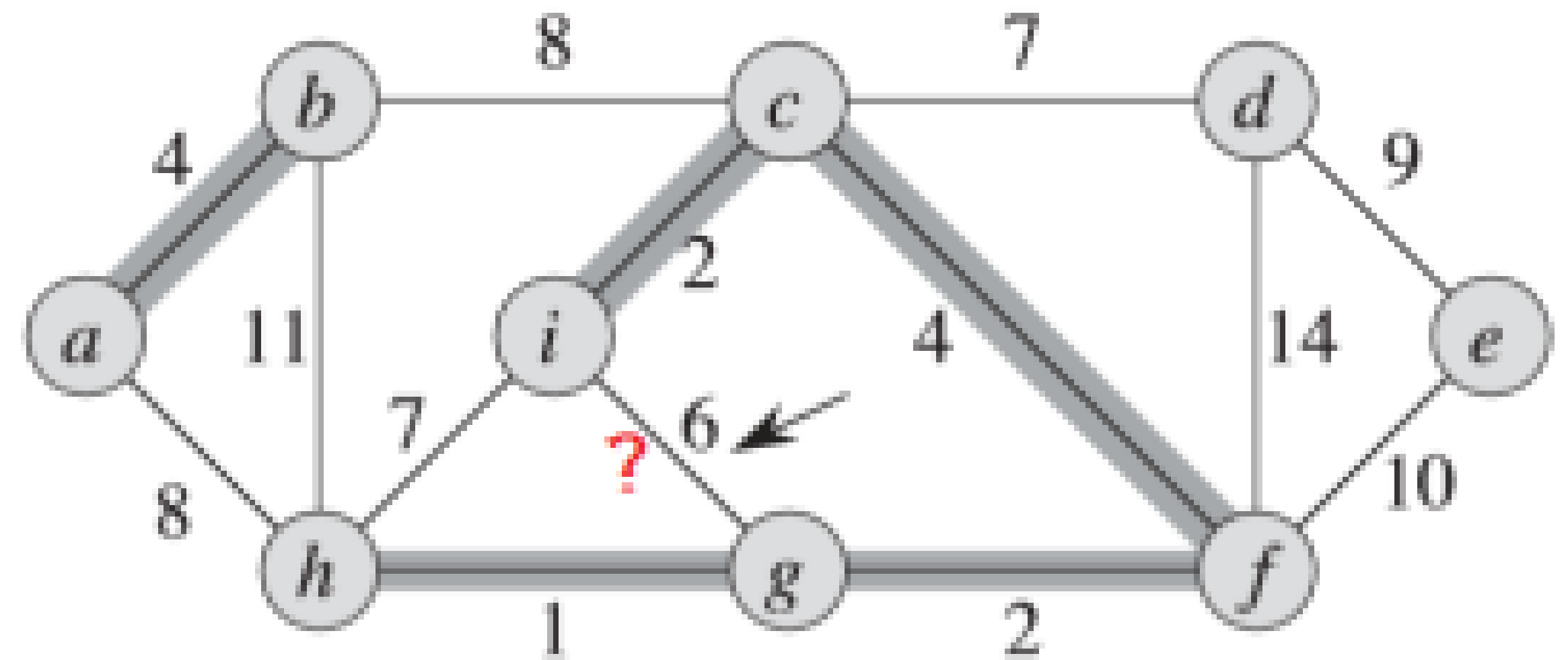
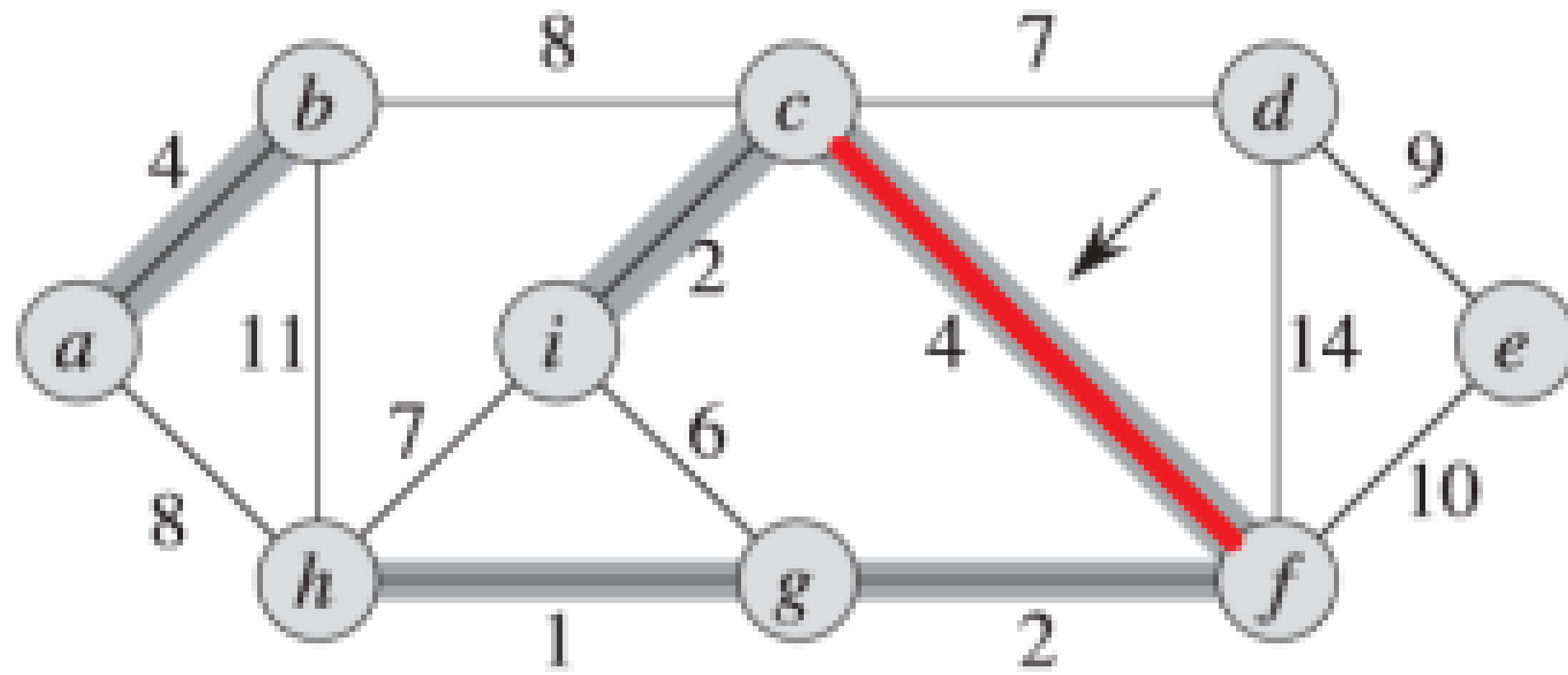
Finding MST?



Finding MST



Finding MST



Time Complexity

- **AL representation**
 - $O(|V|)$ // Creating a graph T with $|V|$ vertices but not edges
 - $O(|E|)$ // Creating a list of edges
 - $O(|E| \log |E|)$ // Sorting edges
 - $O(|E|) * O(|V|)$ // For each edge, checking if (u,v) are already connected in T
 - **Total: $O(|E| |V| + |E| \log E)$**
- Find the complexity with AM

Prim's Algorithm for finding MST

Create a new graph T with same vertices as G but no edges yet

Choose an arbitrary Starting vertex and add it to the visited set

While T does not have all vertices

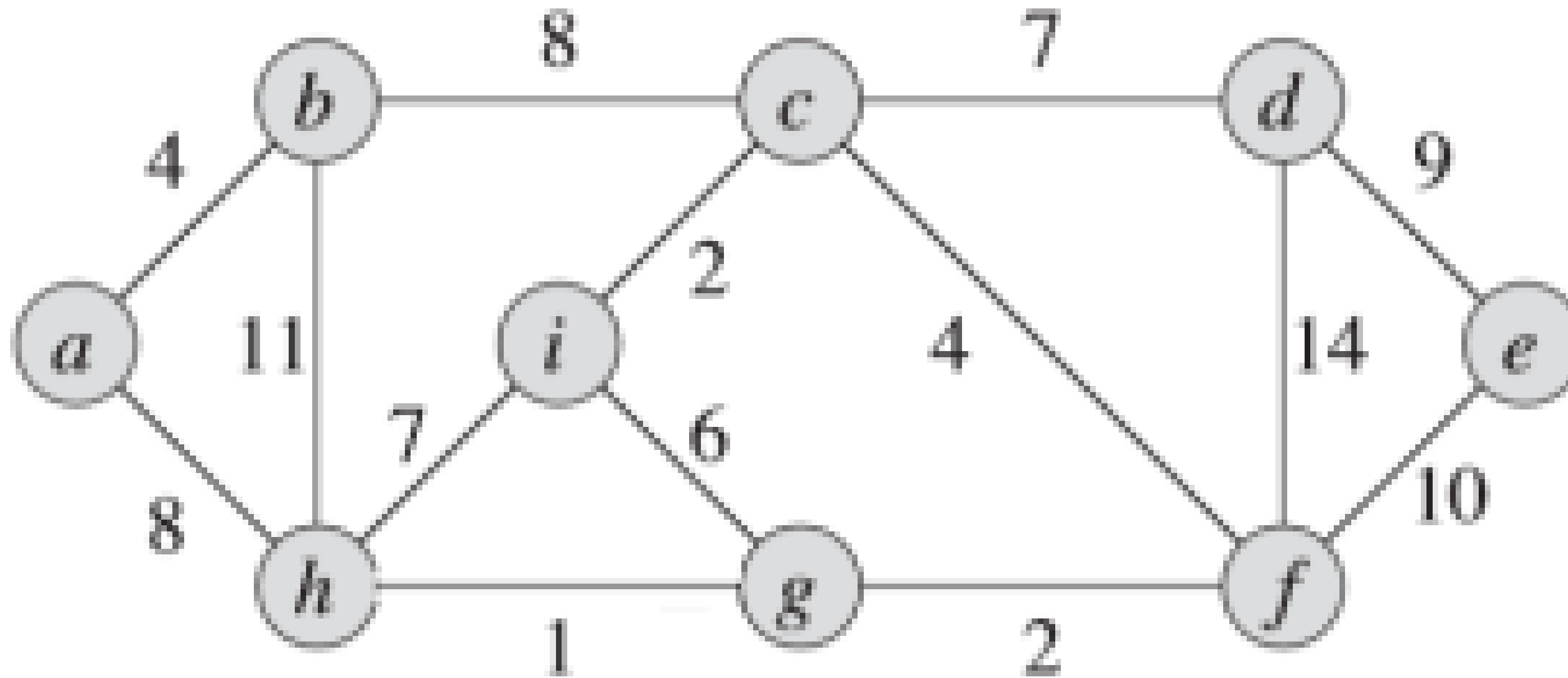
From the set of visited vertices, find the smallest weight edge that connects to an unvisited vertex

Add that edge to T

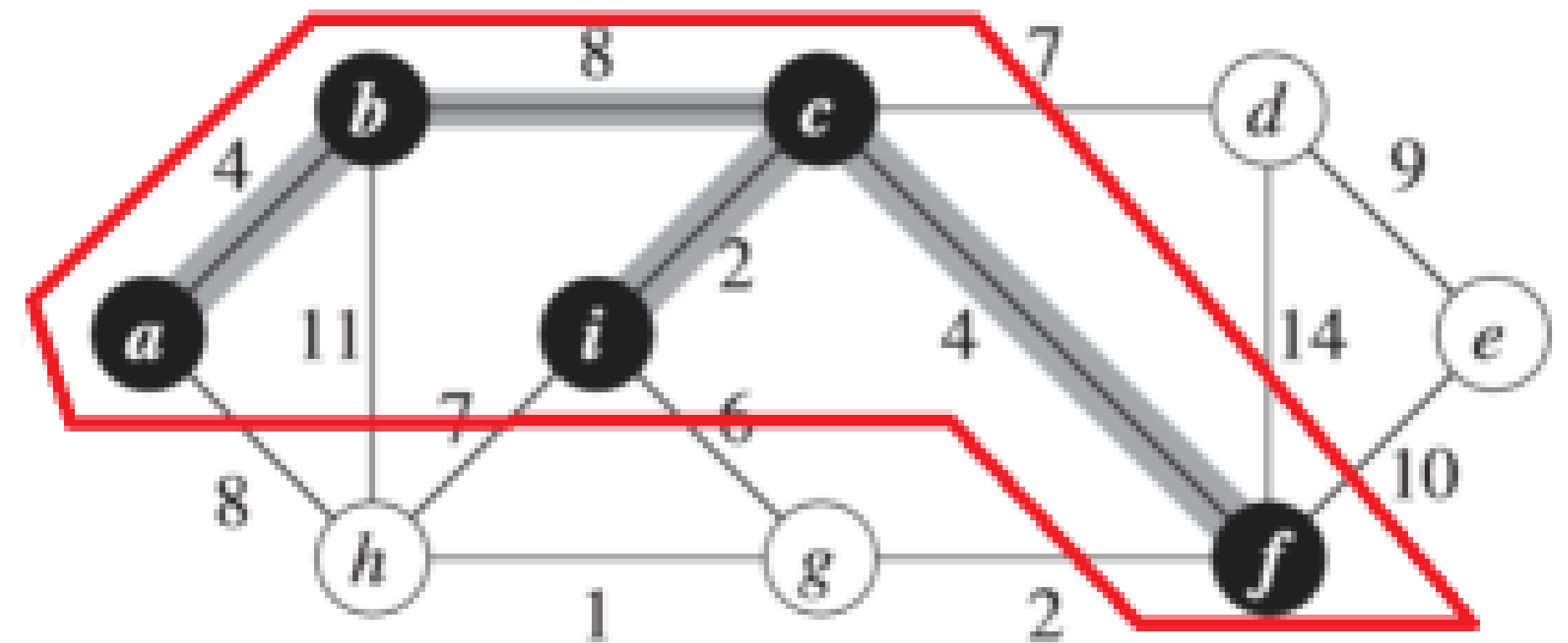
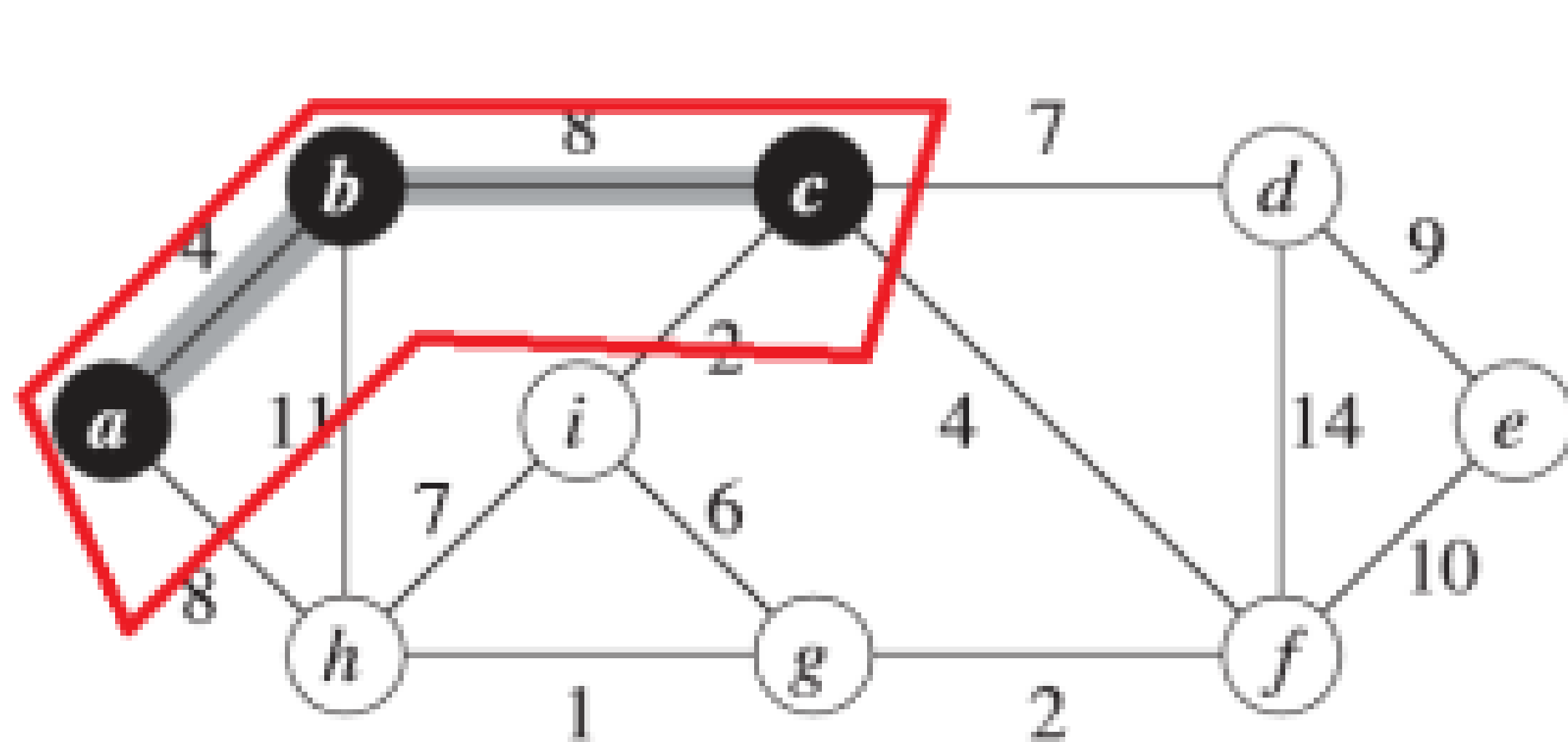
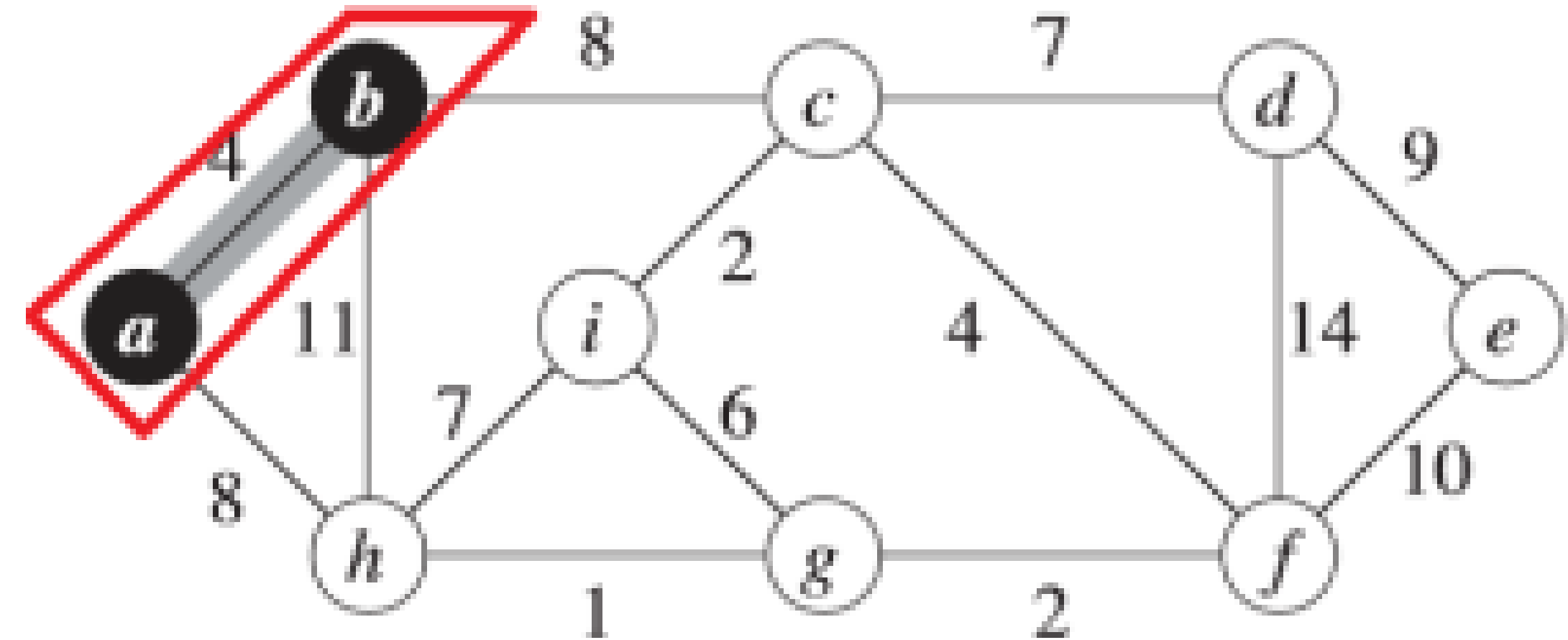
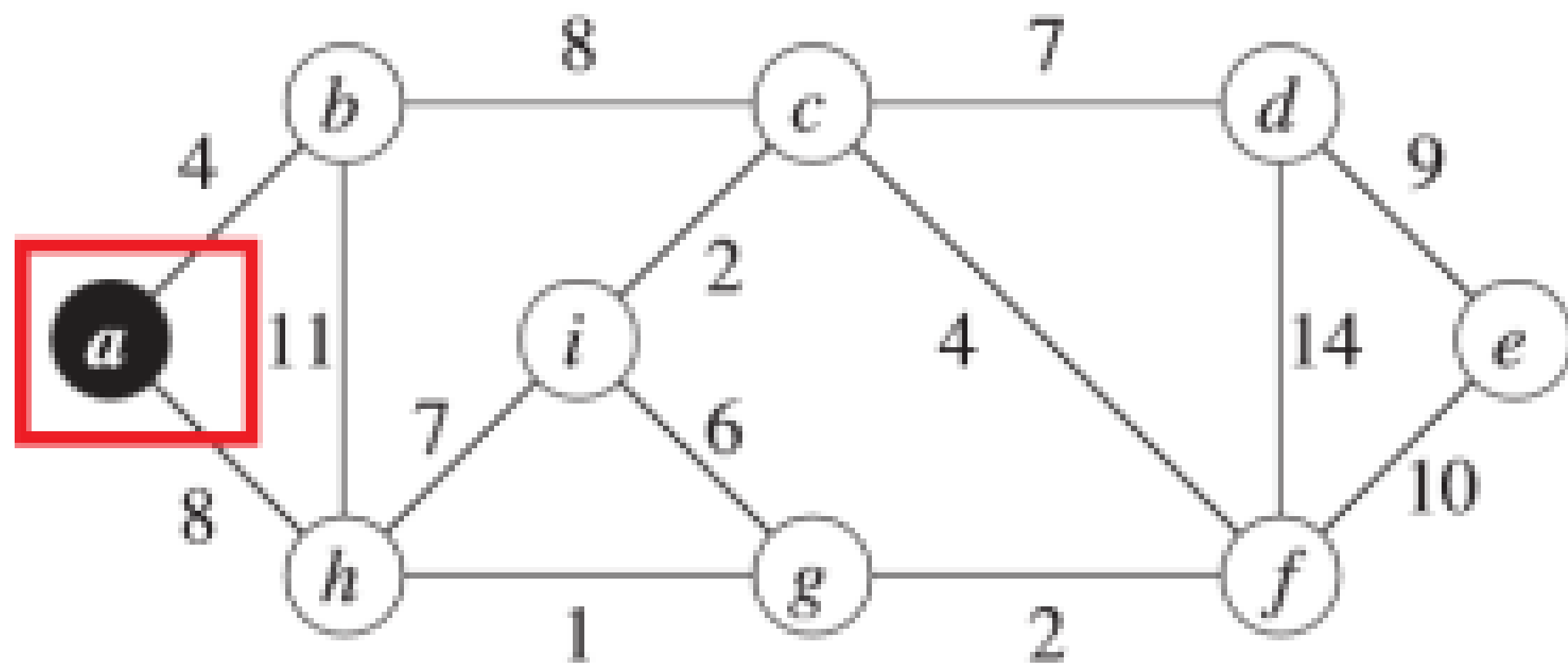
Add the newly reached vertex to the visited set

Finding MST – Approach 2

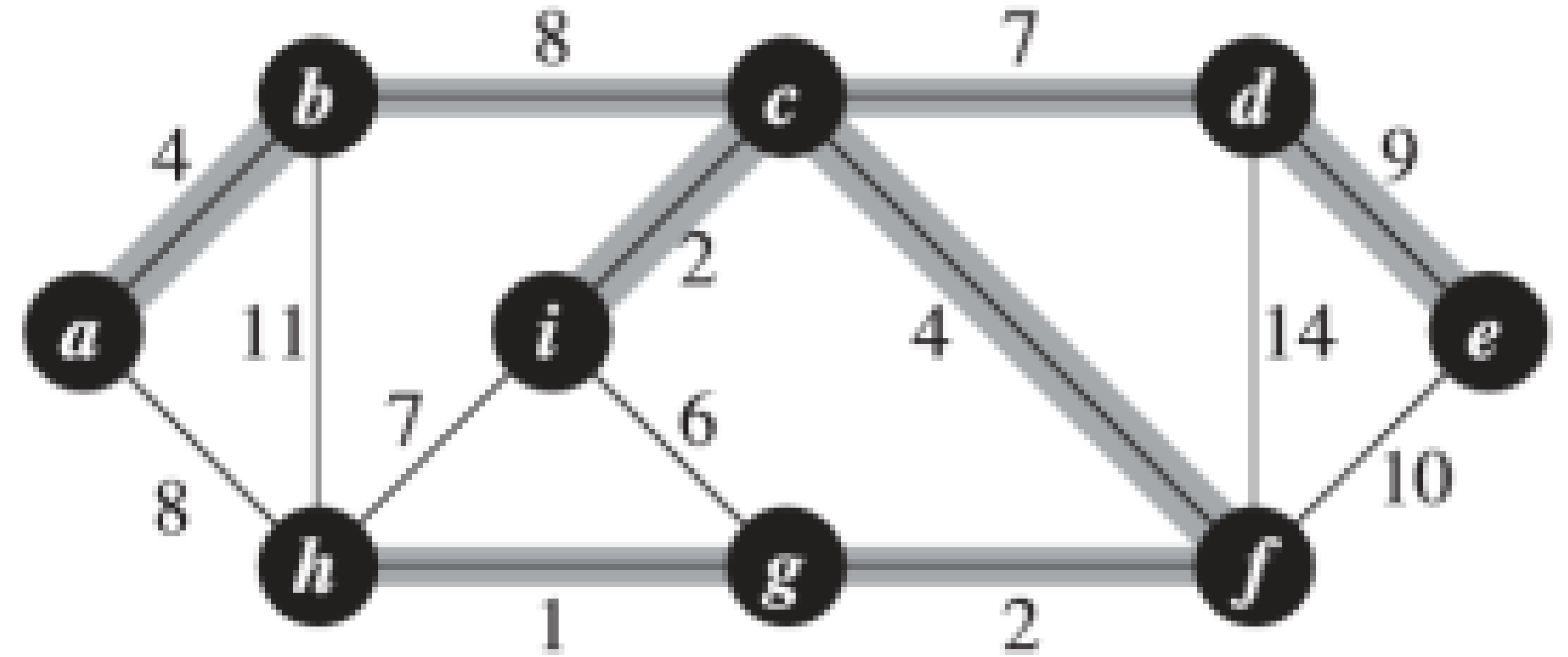
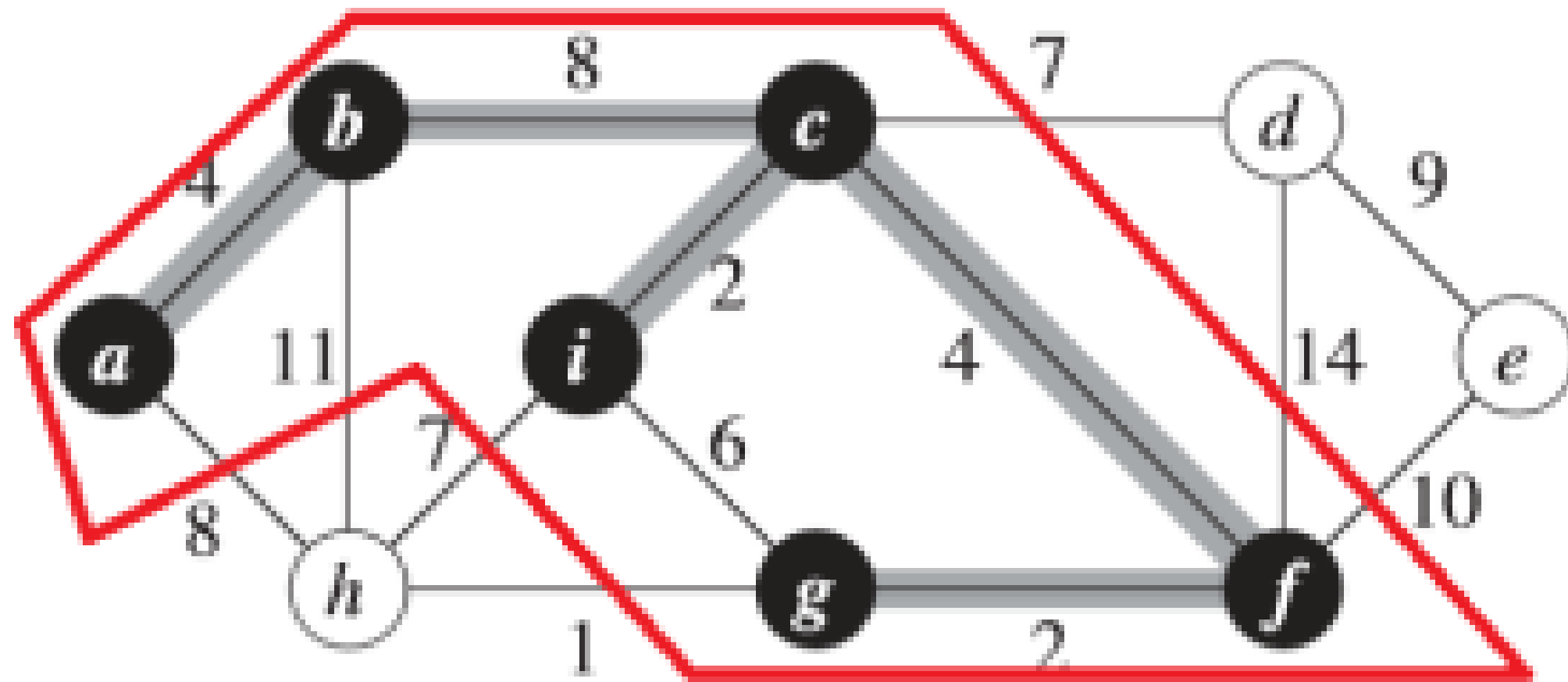
- Start from an arbitrary vertex



Finding MST – Approach 2

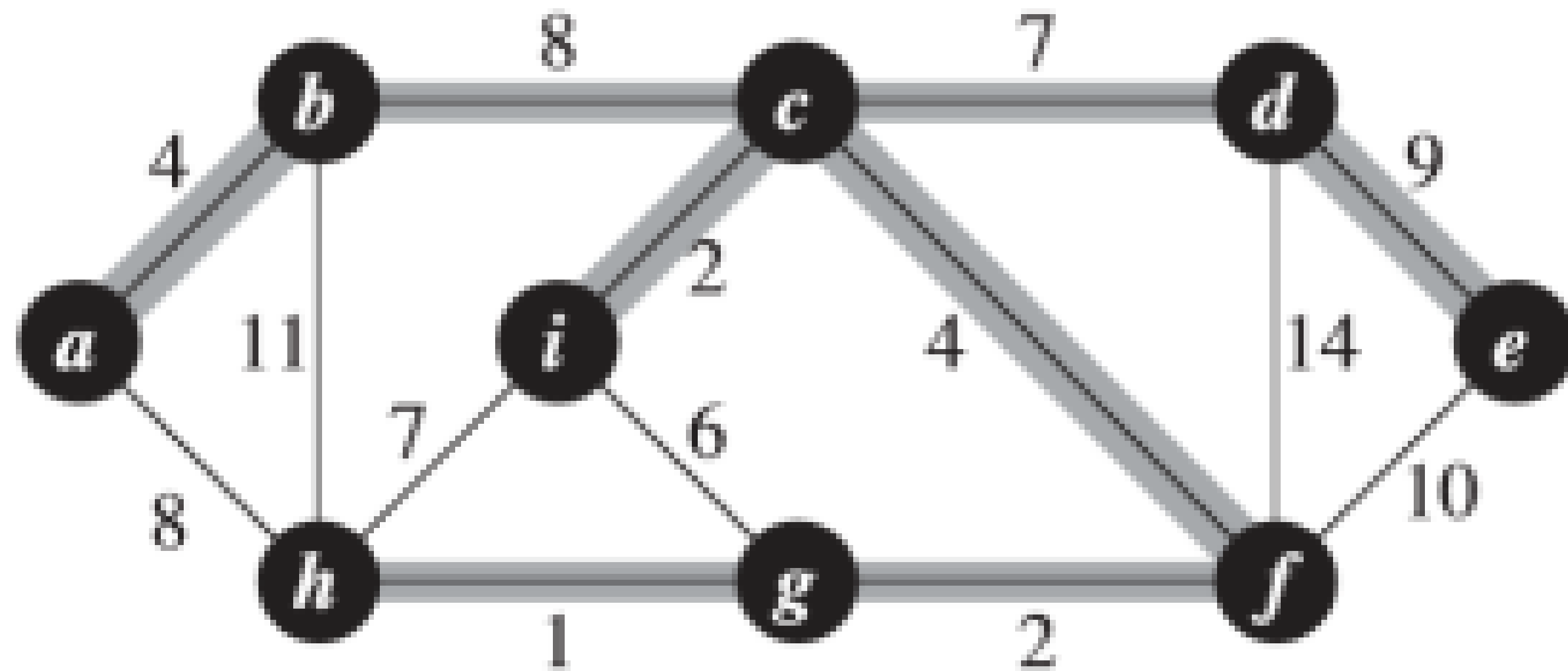


Finding MST – Approach 2



Prim's Algorithm

- Is it **optimal**?
- Is it the **Minimum Spanning Tree (MST)**?
- This is **Prim's algorithm** to compute MST



Prim's Algorithm – Time Complexity

- Time Complexity: $O((E + V)\log V)$
 - Implemented using binary heap and adjacency list
 - Insertion – $O(\log V)$, total of V insertions $O(V \log V)$
 - Remove min – $O(\log V)$, for V vertices $O(E \log V)$
 - Edge selection – $O(E)$
 - What will be the time complexity, if we use adjacency matrix?

Kruskal's Algorithm

- Simple to implement
- Works well with edge lists
- Slower for dense graphs due to sorting all edges

Prim's Algorithm

- Efficient for dense graphs
- Naturally fits with adjacency list representation
- Needs a priority queue

You are running Kruskal's algorithm on a connected graph G and you come across an edge with weight 10 that connects two vertices already in the same tree. What should Kruskal's algorithm do?

Include the edge

0%

Exclude the edge

0%

Include it only if it's the lightest edge

0%

Restart from other vertex

0%

Which of the following is true about Kruskal's and Prim's algorithms?

Both always give the same spanning tree

0%

Prim's works without a priority queue

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Prim's algorithm may form cycles temporarily

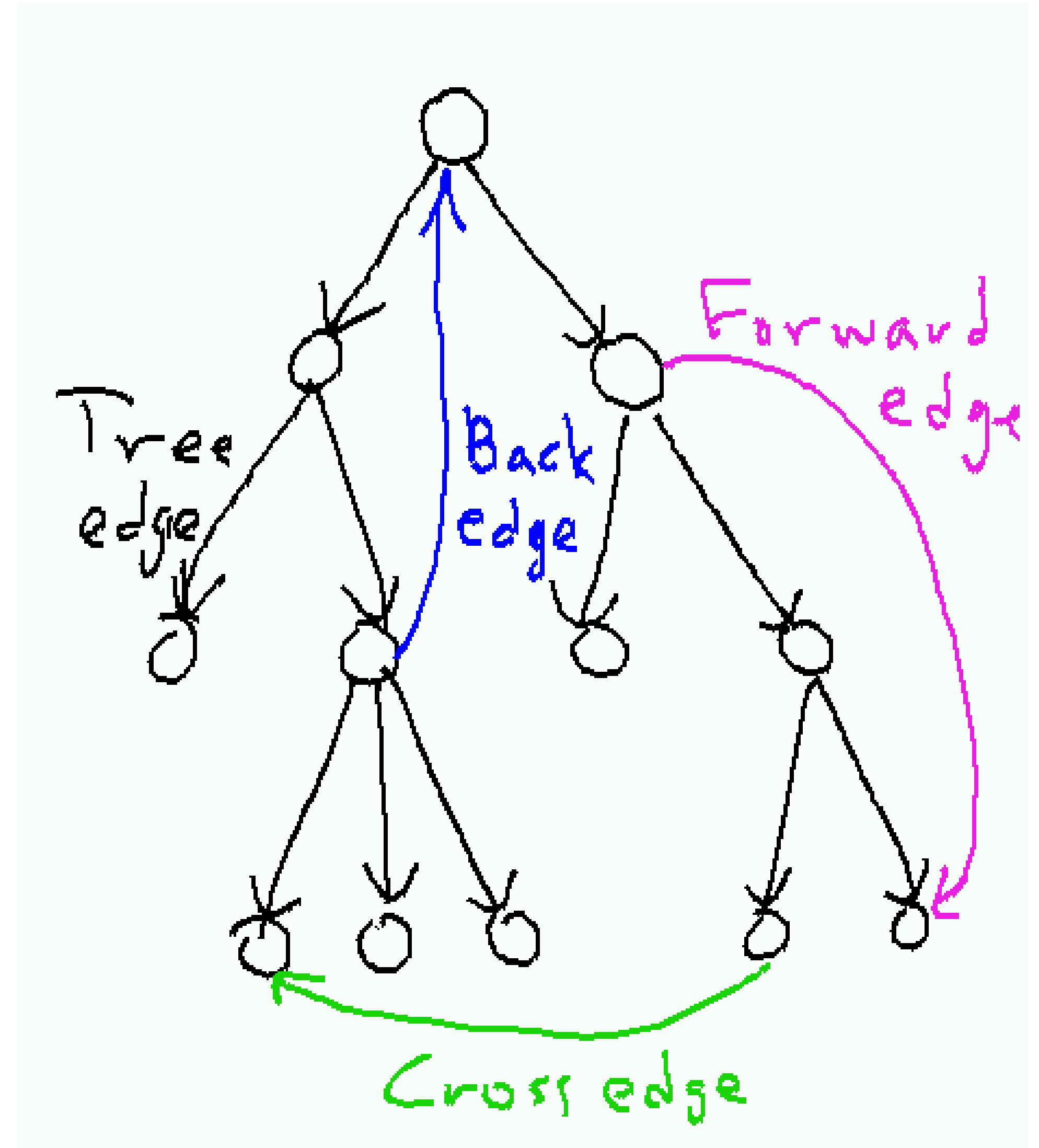
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Kruskal's algorithm may work with disconnected graphs

0%

Edge Types

- Tree Edge
 - Leads to unvisited vertex, i.e., first discovery of the node
- Back Edge
 - Points to an ancestor in the graph,
- Forward Edge
 - Points to descendant already explored
- Cross Edge
 - Connect nodes in the different branches



Thank you!