

# **FIT2004**

## **Algorithms and Data Structures**

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Referencing materials by  
Nathan Compane, Aamir Cheema, Arun Konagurthu and Lloyd Allison



# Faculty of Information Technology, Monash University

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Ready?

# Agenda

- Minimum Spanning Tree (MST)

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- Minimum Spanning Tree (MST)
  - Prim's algorithm
  - Kruskal's algorithm

Let us begin...

# Minimum Spanning Tree

What is it?

# Minimum Spanning Tree

What is it?

- A tree



# Minimum Spanning Tree

What is it?

- A tree
- Spanning every vertex

# Minimum Spanning Tree

What is it?

- A tree
- Spanning every vertex
- Minimum total edges

# Minimum Spanning Tree

What is it?

- A tree
- Spanning every vertex
  - Minimum number of edges to connect all vertex? True or False?
  - Maximum number of edges in graph without cycle? True or False?
- Minimum total edges weight

# Minimum Spanning Tree

## What is it?

- A tree
  - No cycle
  - Undirected
- Spanning every vertex
  - Minimum number of edges to connect all vertex
  - Maximum number of edges in graph without cycle
- Minimum total edges weight



# Minimum Spanning Tree

## What is it?

- A tree
  - No cycle
  - Undirected
- Spanning every vertex
  - Minimum number of edges to connect all vertex
  - Maximum number of edges in graph without cycle
- Minimum total edges weight

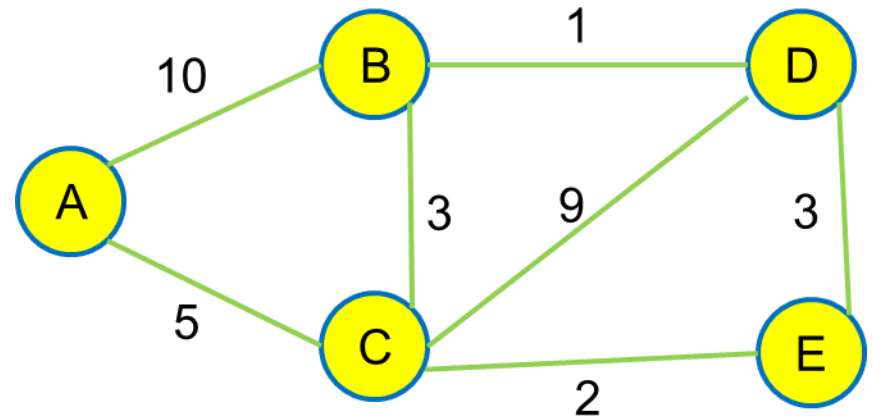
## Spanning Tree:

- A **spanning tree** of a general undirected weighted graph  $G$  is a tree that **spans**  $G$  (i.e., a tree that includes every vertex of  $G$ ) and is a **subgraph** of  $G$  (i.e., every edge in the spanning tree belongs to  $G$ ).

# Minimum Spanning Tree

What is it?

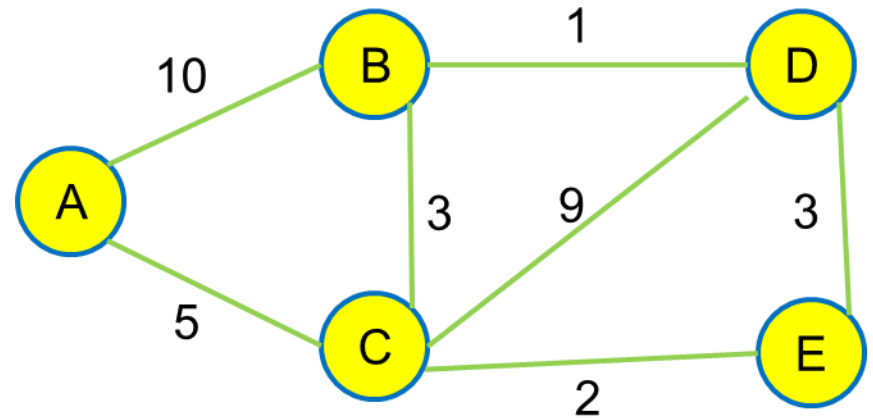
- Let say we have a graph



# Minimum Spanning Tree

What is it?

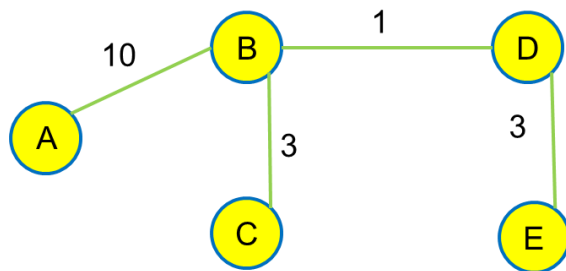
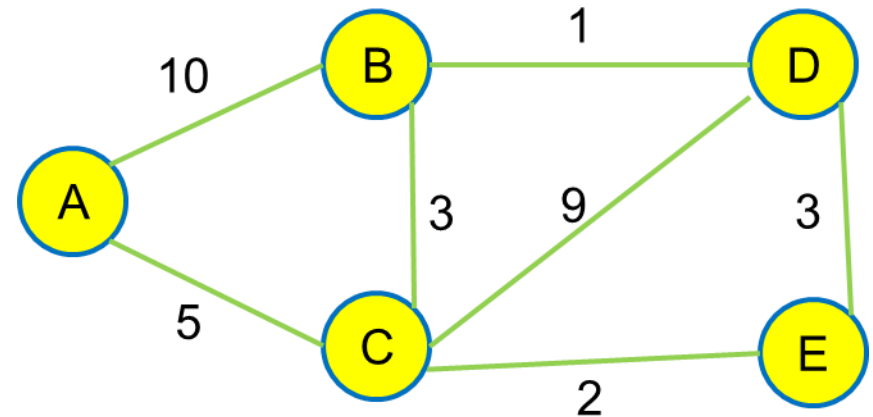
- Let say we have a graph
  - Can you form spanning trees?



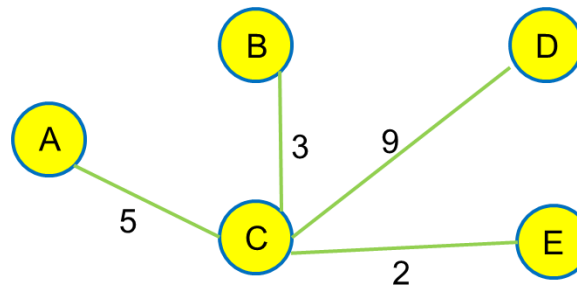
# Minimum Spanning Tree

## What is it?

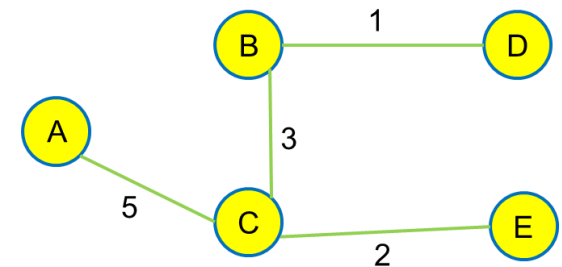
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  - Can you form spanning trees?



Spanning Tree 1



Spanning Tree 2



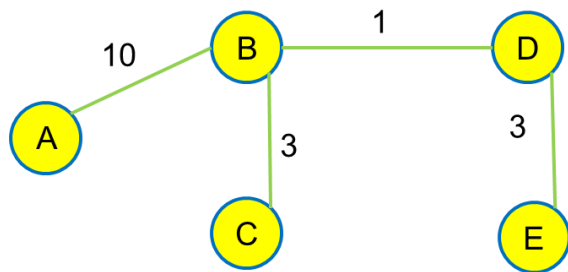
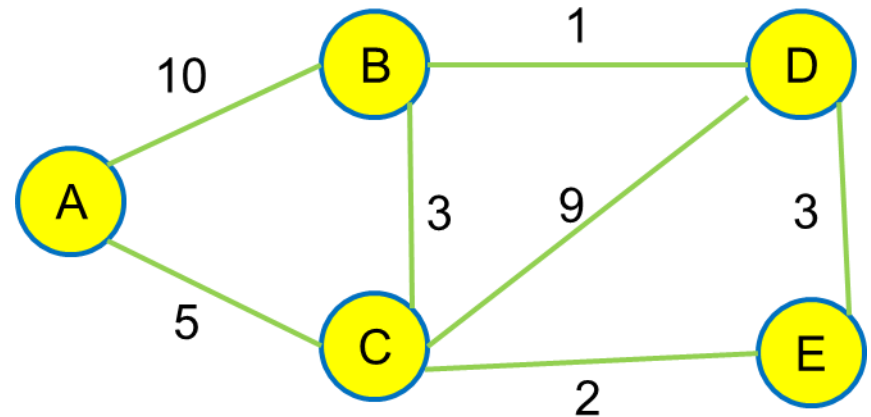
Spanning Tree 3



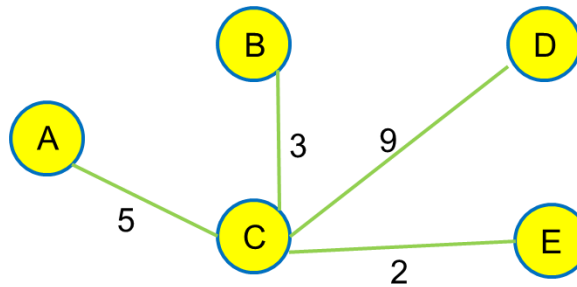
# Minimum Spanning Tree

## What is it?

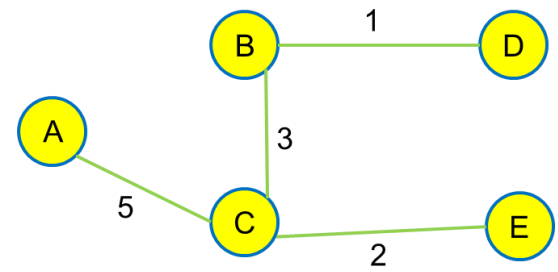
- Let say we have a graph
  - Can you form spanning trees?
  - Which is the minimum?



Spanning Tree 1



Spanning Tree 2

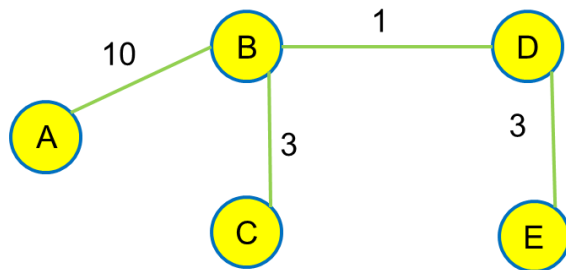
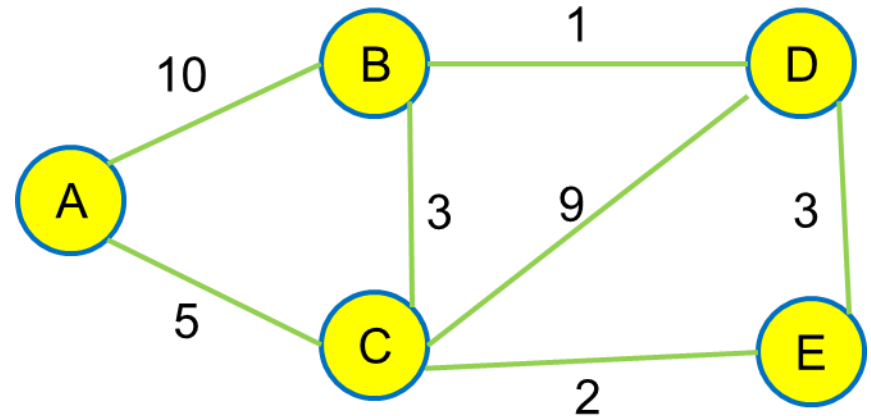


Spanning Tree 3

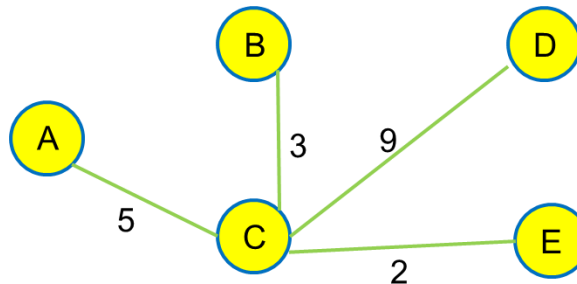
# Minimum Spanning Tree

## What is it?

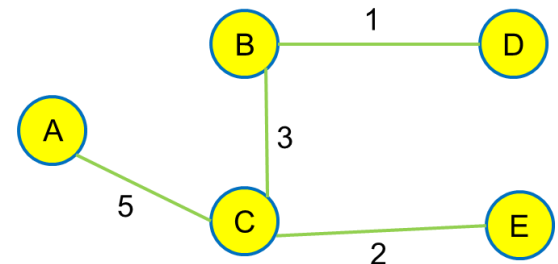
- Let say we have a graph
  - Can you form spanning trees?
  - Which is the minimum?
    - Tree 1 =  $10 + 1 + 3 + 3$
    - Tree 2 =  $5 + 3 + 9 + 2$
    - Tree 3 =  $5 + 3 + 2 + 1$



Spanning Tree 1



Spanning Tree 2

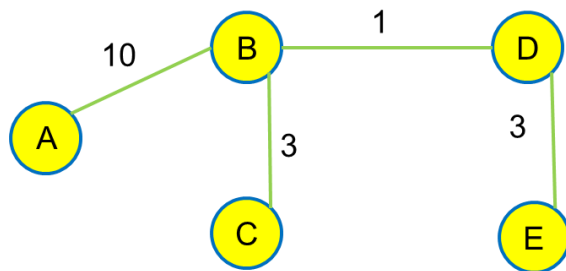
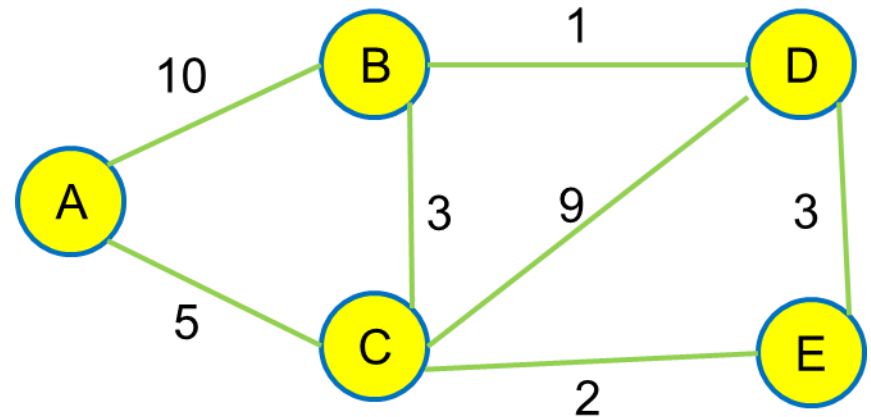


Spanning Tree 3

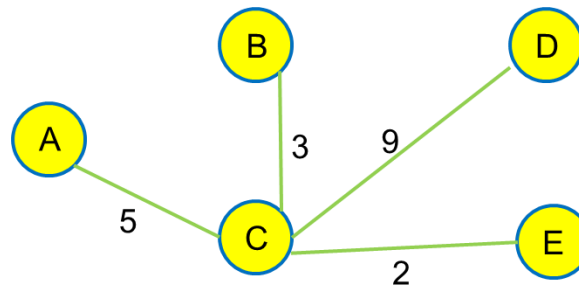
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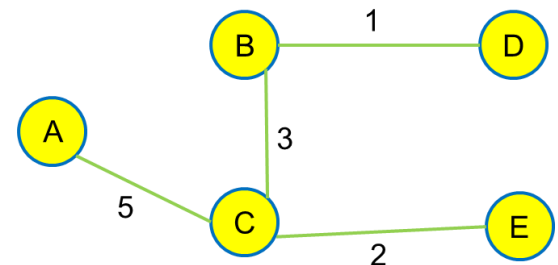
- Let say we have a graph
  - Can you form spanning trees?
  - Which is the minimum?
    - Tree 1 =  $10 + 1 + 3 + 3 = 17$
    - Tree 2 =  $5 + 3 + 9 + 2 = 19$
    - Tree 3 =  $5 + 3 + 2 + 1 = 11$



Spanning Tree 1



Spanning Tree 2



Spanning Tree 3

# Minimum Spanning Tree

## What is it?

- Let say we have a graph
  - Can you form spanning trees?
  - Which is the minimum?

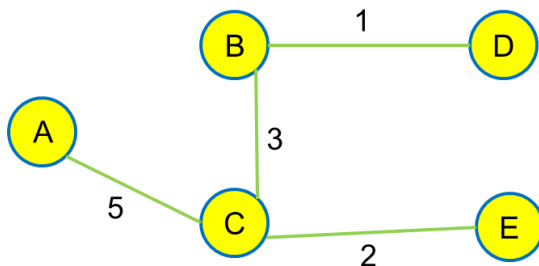
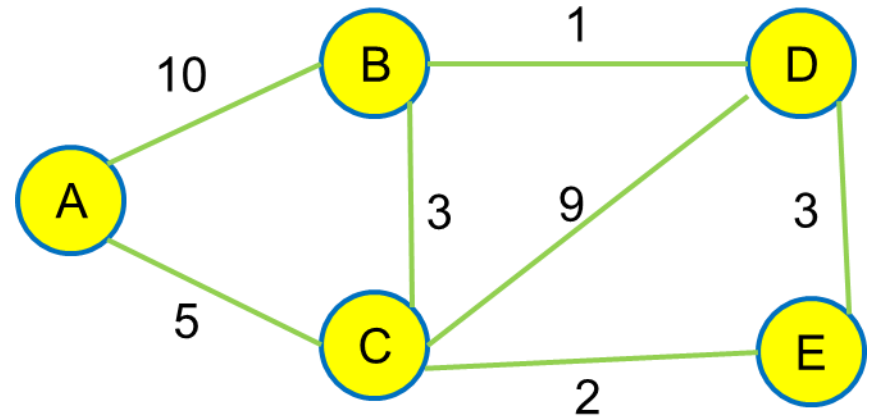
- Tree 1 =  $10 + 1 + 3 + 3 = 17$

- Tree 2 =  $5 + 3 + 9 + 2 = 19$

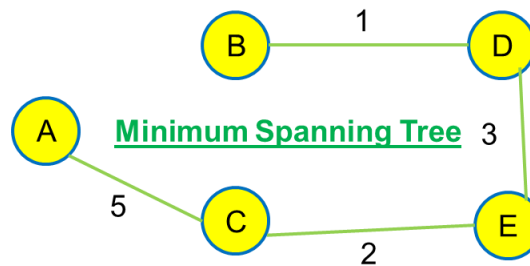
- Tree 3 =  $5 + 3 + 2 + 1 = 11$

- Tree 4 =  $5 + 2 + 3 + 1 = 11$

} Not unique



Spanning Tree 3



Spanning Tree 4

Questions?

# Minimum Spanning Tree

How to build it?

- Prim's
- Kruskal's

# Minimum Spanning Tree

## How to build it?

- Prim's
  - Growing of tree
- Kruskal's
  - Merging of trees

# Minimum Spanning Tree

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- Prim's
  - Growing of tree
- Kruskal's
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- Both are greedy



# Minimum Spanning Tree

## How to build it?

- Prim's
  - Growing of tree
- Kruskal's
  - Merging of trees
- Both are greedy
  - Choose local optimal
  - Believe to get global optimal

# Minimum Spanning Tree

## How to build it?

- Prim's
  - Growing of tree
- Kruskal's
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- Both are greedy
  - Choose local optimal
  - Believe to get global optimal
  - We will learn to prove it later

# Minimum Spanning Tree

## How to build it?

- Prim's
  - Growing of tree
  - Very similar to Dijkstra's. Can be known a Prim-Dijkstra
- Kruskal's
  - Merging of trees
- Both are greedy
  - Choose local optimal
  - Believe to get global optimal
  - We will learn to prove it later

# Minimum Spanning Tree

## How to build it?

- Prim's
  - Growing of tree
  - Very similar to Dijkstra's. Can be known a Prim-Dijkstra  
Instead of nearest vertex from source, it is nearest vertex from tree!
- Kruskal's
  - Merging of trees
- Both are greedy
  - Choose local optimal
  - Believe to get global optimal
  - We will learn to prove it later

Questions?

# Prim's Algorithm

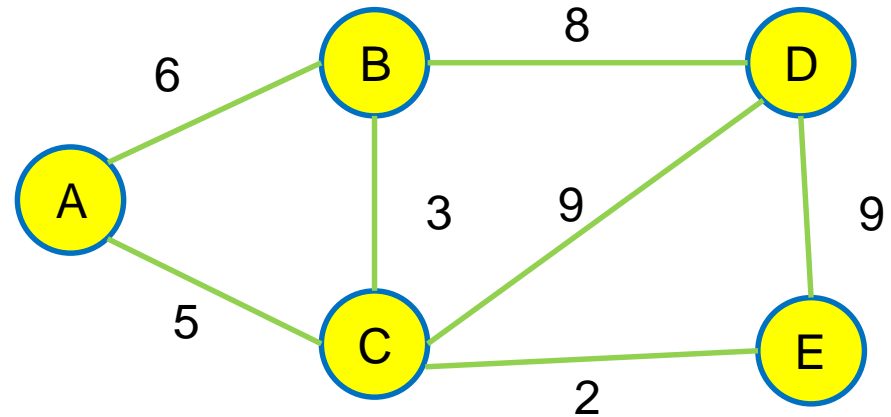
## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree

# Prim's Algorithm

## Growing of MST

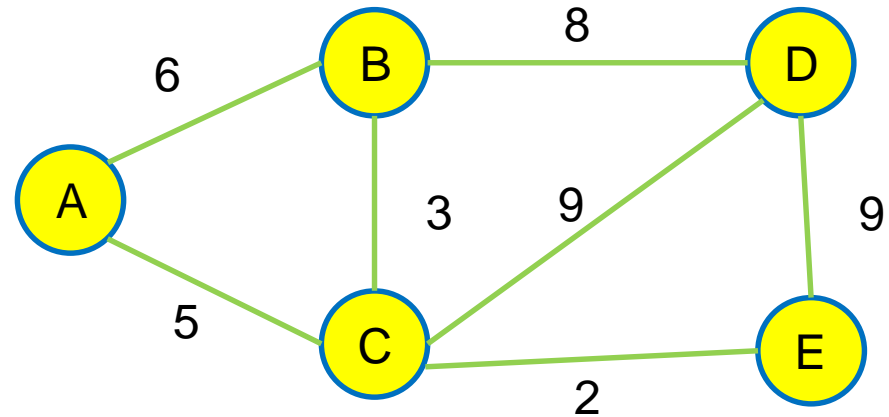
- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out



# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out



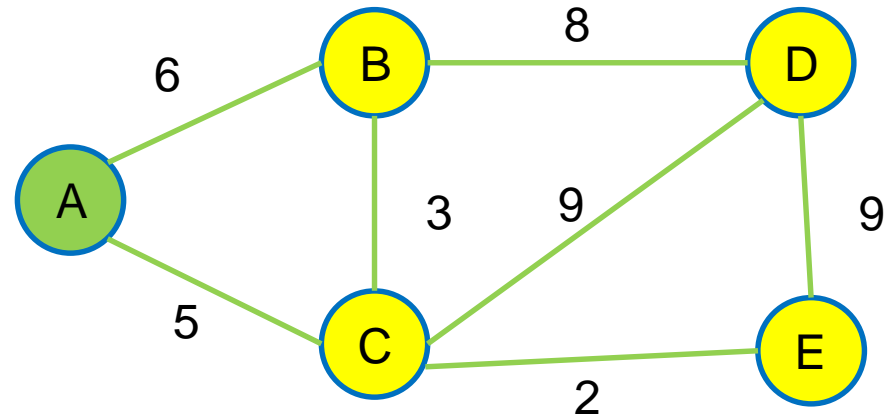
A	B	C	D	E
0	inf	inf	inf	inf



# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A

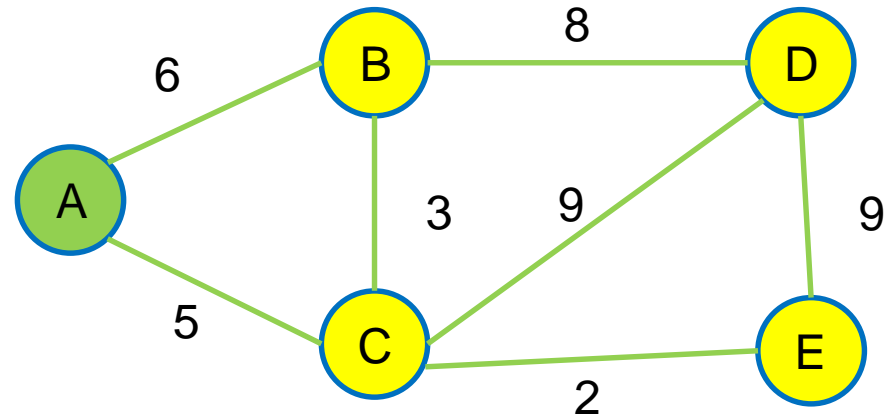


A	B	C	D	E
0	inf	inf	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A
  - Update adjacent B and C

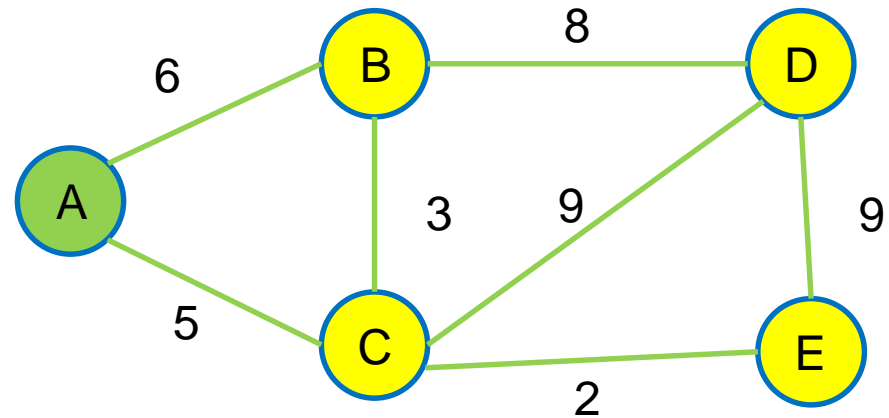


A	B	C	D	E
0	6, A	inf	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A
  - Update adjacent B and C

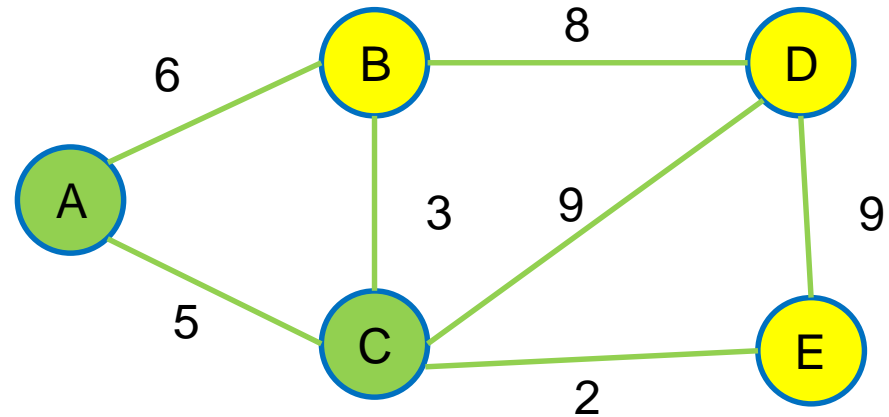


A	B	C	D	E
0	6, A	5, A	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C

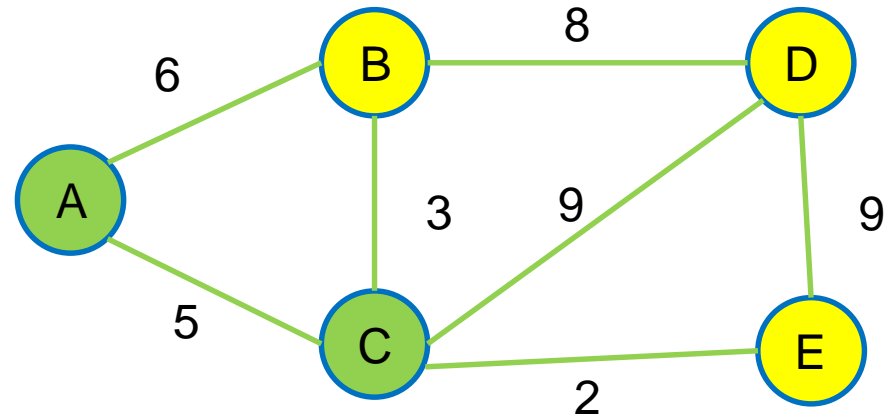


A	B	C	D	E
0	6, A	5, A	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
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  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E

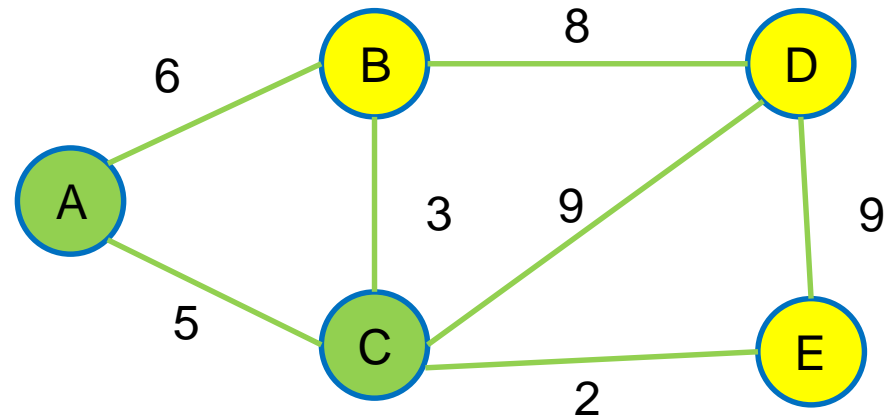


A	B	C	D	E
0	6	5, A	inf	inf

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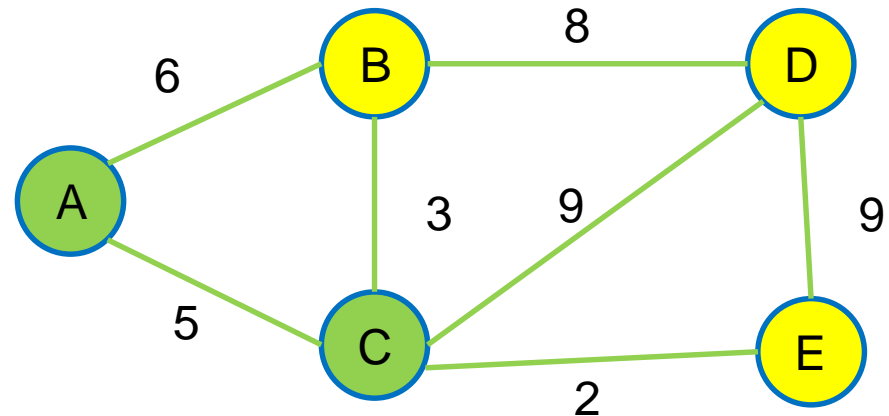


A	B	C	D	E
0	6vs3	5, A	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
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  - Let us try it out
  - Start from A
  - Update adjacent B and C
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  - Update adjacent B, D, E

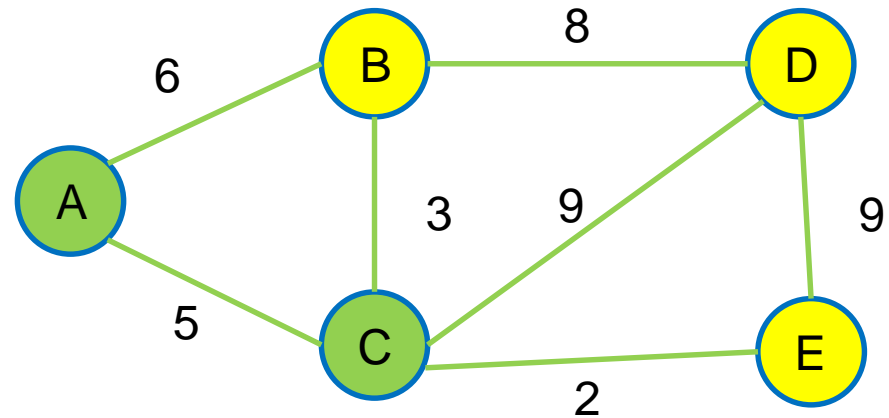


A	B	C	D	E
0	3, C	5, A	inf	inf

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E



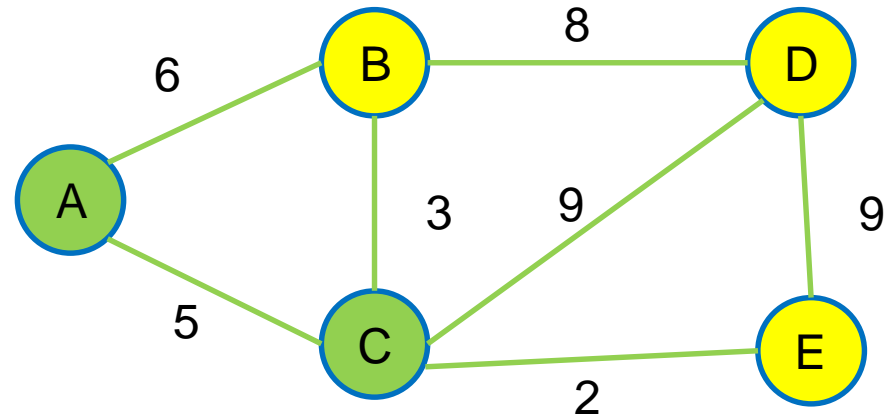
A	B	C	D	E
0	3, C	5, A	9, C	inf



# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
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  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E

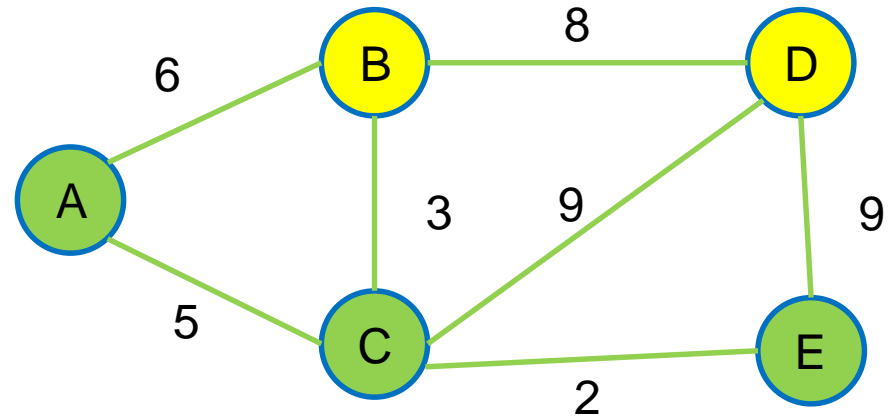


A	B	C	D	E
0	3, C	5, A	9, C	2, C

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
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  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E
  - Choose closest E

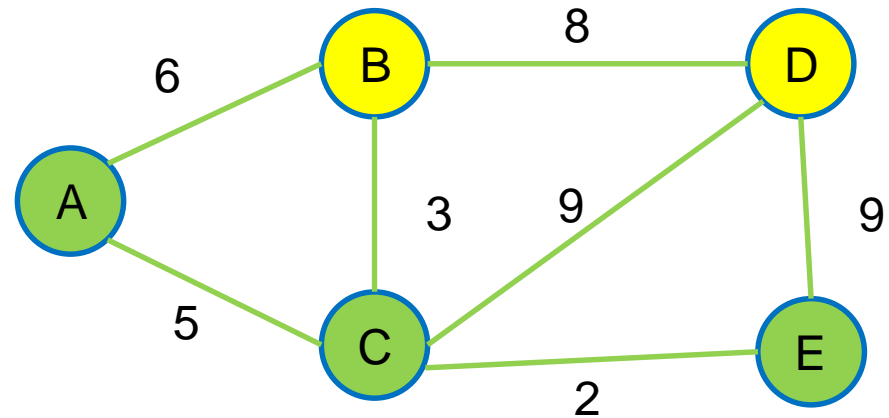


A	B	C	D	E
0	3, C	5, A	9, C	2, C

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
  - Let us try it out
  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D

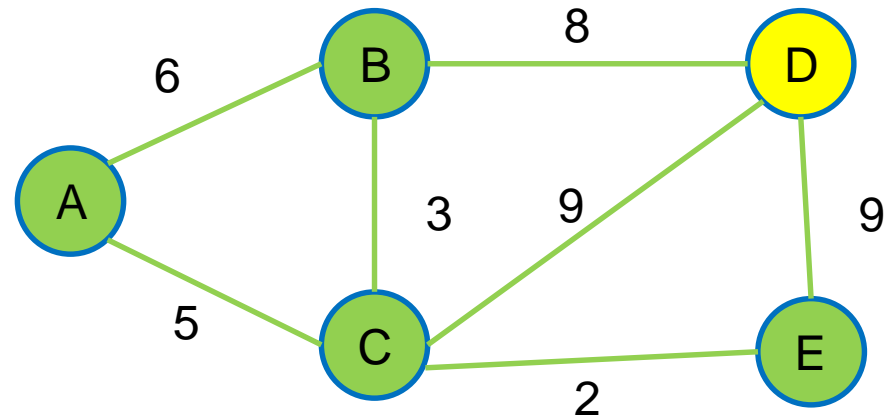


A	B	C	D	E
0	3, C	5, A	9, C	2, C

# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
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  - Start from A
  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D
  - Choose closest B

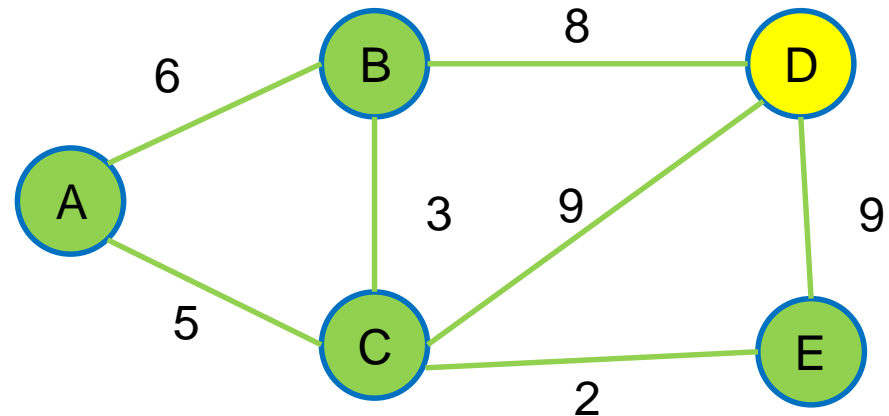


A	B	C	D	E
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# Prim's Algorithm

## Growing of MST

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  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D
  - Choose closest B
  - Update adjacent D

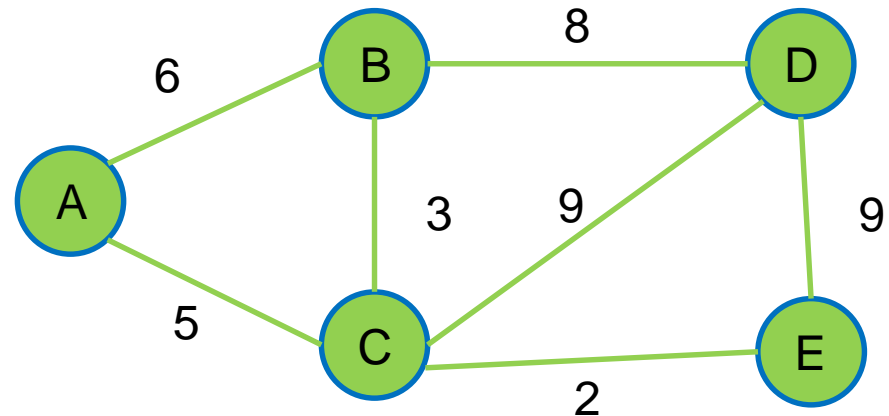


A	B	C	D	E
0	3, C	5, A	8, B	2, C

# Prim's Algorithm

## Growing of MST

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  - Choosing nearest vertex to tree
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  - Start from A
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  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D
  - Choose closest B
  - Update adjacent D
  - Choose closest D

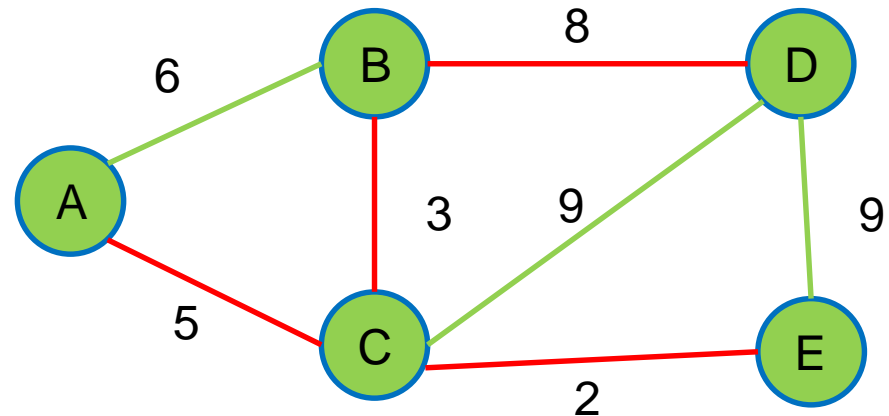


A	B	C	D	E
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- Very similar to Dijkstra
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  - Update adjacent B and C
  - Choose closest C
  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D
  - Choose closest B
  - Update adjacent D
  - Choose closest D
  - Have all of the edges

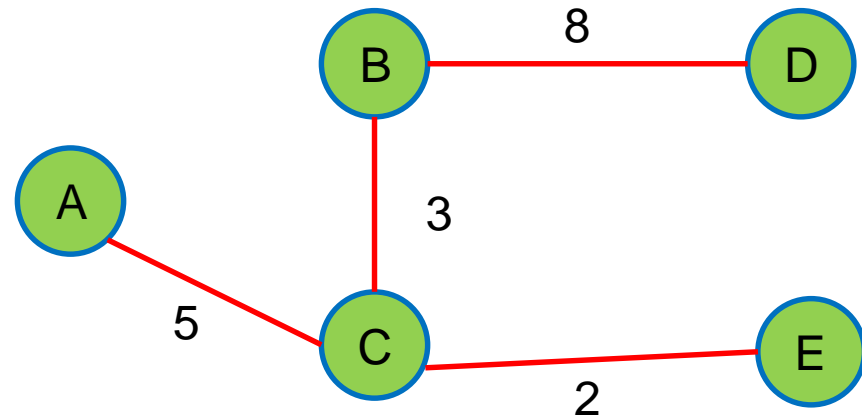


A	B	C	D	E
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# Prim's Algorithm

## Growing of MST

- Very similar to Dijkstra
  - Choosing nearest vertex to tree
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  - Update adjacent B, D, E
  - Choose closest E
  - Update adjacent D
  - Choose closest B
  - Update adjacent D
  - Choose closest D
  - Have all of the edges



A	B	C	D	E
0	3, C	5, A	8, B	2, C



# Prim's Algorithm

## Growing of MST

- So take Dijkstra
  - Modify the distance update/ calculation for edge  $\langle u, v, w \rangle$ 
    - Instead of  $v.\text{distance} = u.\text{distance} + w$
    - Change to  $v.\text{distance} = w$

# Prim's Algorithm

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    - Perform relaxation only if distance is smaller

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- So what is the complexity?

# Prim's Algorithm

## Growing of MST

- So take Dijkstra
  - Modify the distance update/ calculation for edge  $\langle u, v, w \rangle$ 
    - Instead of  $v.\text{distance} = u.\text{distance} + w$
    - Change to  $v.\text{distance} = w$
    - Perform relaxation only if distance is smaller
- So what is the complexity?
  - Same as Dijkstra  $O(V \log V + E \log V)$
  - Thus  $O(E \log V)$

Questions?

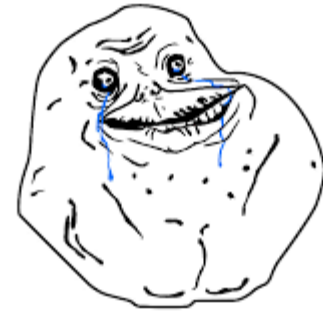
# Kruskal's Algorithm

## Combining (Union of) Trees

# Kruskal's Algorithm

## Combining (Union of) Trees

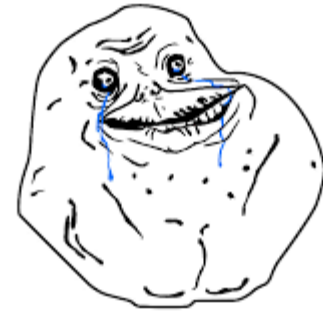
- Imagine every vertex is a tree
  - Only 1 node #ForeverAlone



# Kruskal's Algorithm

## Combining (Union of) Trees

- Imagine every vertex is a tree
  - Only 1 node #ForeverAlone
  - Trees are connected by edges

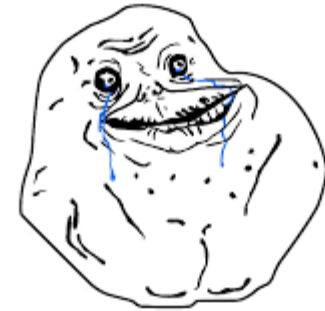




# Kruskal's Algorithm

## Combining (Union of) Trees

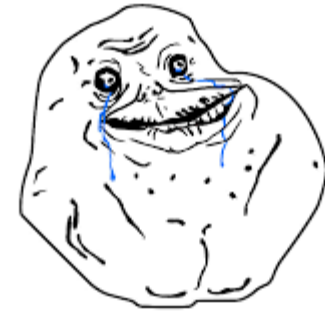
- Imagine every vertex is a tree
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  - Trees are connected by edges
    - Adding edge  $\langle u, v, w \rangle$  combine the trees of vertex  $u$  and vertex  $v$



# Kruskal's Algorithm

## Combining (Union of) Trees

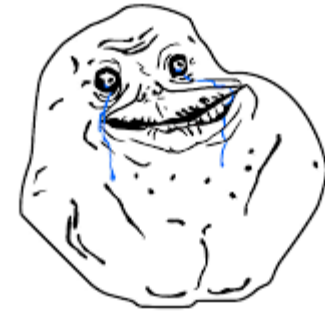
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  - Trees are connected by edges
    - Adding edge  $\langle u, v, w \rangle$  combine the trees of vertex  $u$  and vertex  $v$
    - Only add if vertex  $u$  and vertex  $v$  are not in the same tree. Why?



# Kruskal's Algorithm

## Combining (Union of) Trees

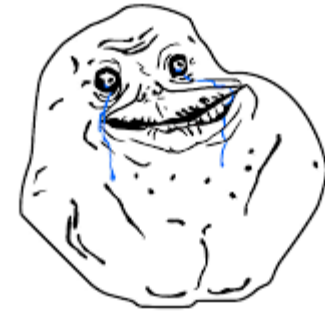
- Imagine every vertex is a tree
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  - Trees are connected by edges
    - Adding edge  $\langle u, v, w \rangle$  combine the trees of vertex  $u$  and vertex  $v$
    - Only add if vertex  $u$  and vertex  $v$  are not in the same tree. Why? **NO CYCLE**



# Kruskal's Algorithm

## Combining (Union of) Trees

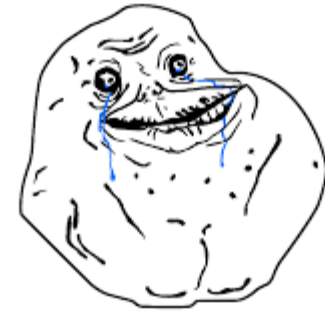
- Imagine every vertex is a tree
  - Only 1 node #ForeverAlone
  - Trees are connected by edges
    - Adding edge  $\langle u, v, w \rangle$  combine the trees of vertex  $u$  and vertex  $v$
    - Only add if vertex  $u$  and vertex  $v$  are not in the same tree. Why? **NO CYCLE**
- So how do we do it?



# Kruskal's Algorithm

## Combining (Union of) Trees

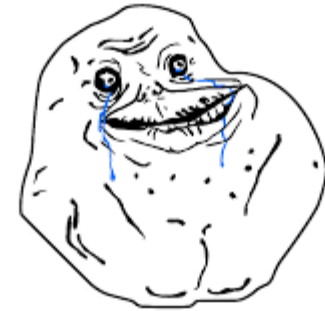
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- So how do we do it?
  - Take add edges
  - Sort it
  - Then go through the edges one by one



# Kruskal's Algorithm

## Combining (Union of) Trees

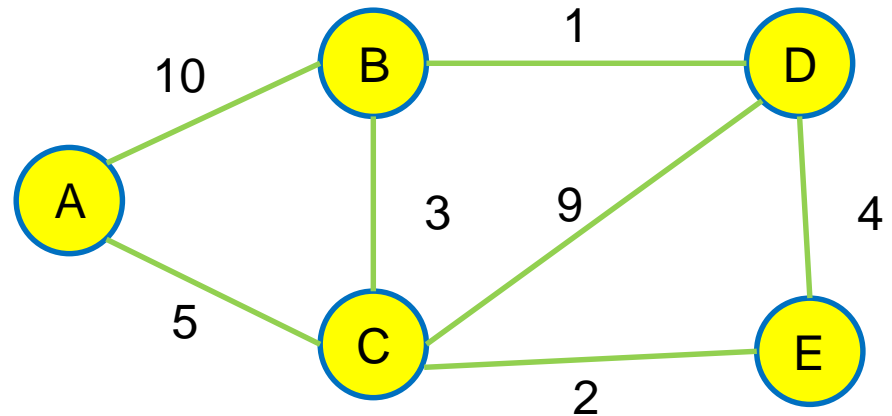
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- So how do we do it?
  - Take add edges
  - Sort it
  - Then go through the edges one by one
  - Let us visualize it...



# Kruskal's Algorithm

## Combining (Union of) Trees

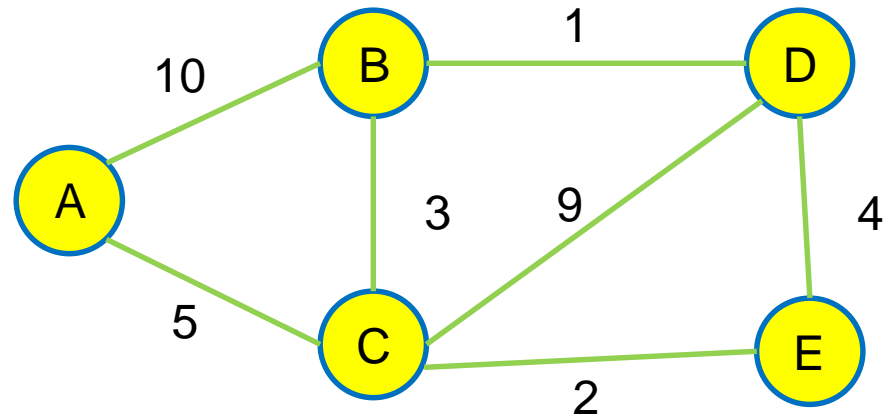
- Look at the graph



# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
  - Take all the edges



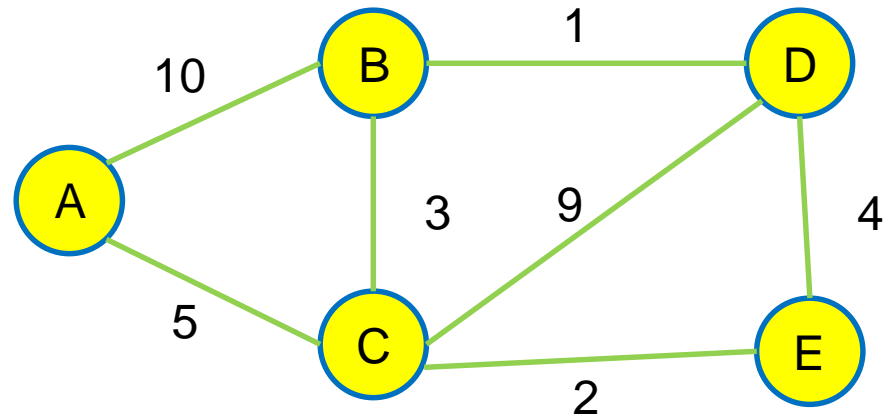
AB	AC	BC	BD	CD	CE	DE
10	5	3	1	9	2	4



# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
  - Take all the edges
  - Sort it



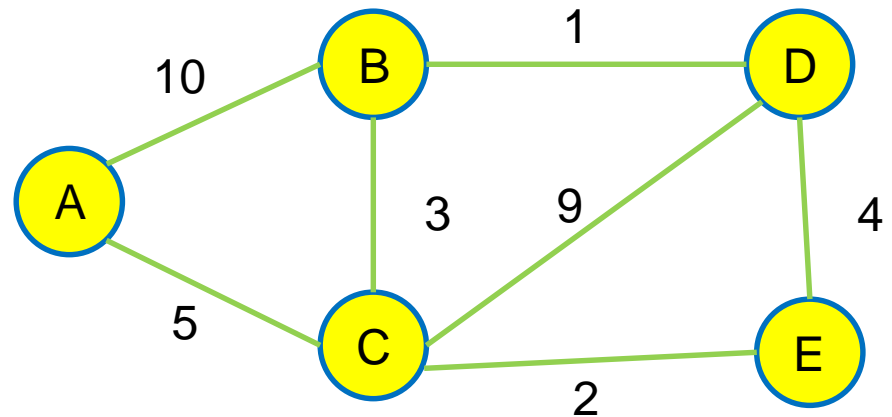
AB	AC	BC	BD	CD	CE	DE
10	5	3	1	9	2	4

BD	CE	BC	DE	AC	CD	AB
1	2	3	4	5	9	10

# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
  - Take all the edges
  - Sort it
  - Go through the edges one by one



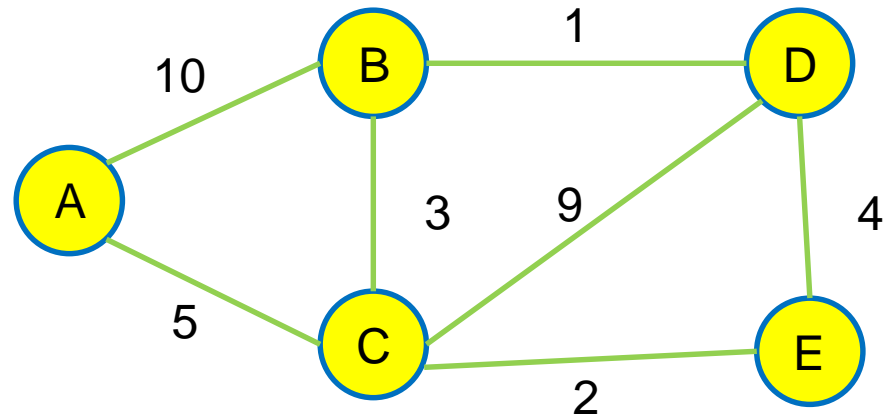
AB	AC	BC	BD	CD	CE	DE
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# Kruskal's Algorithm

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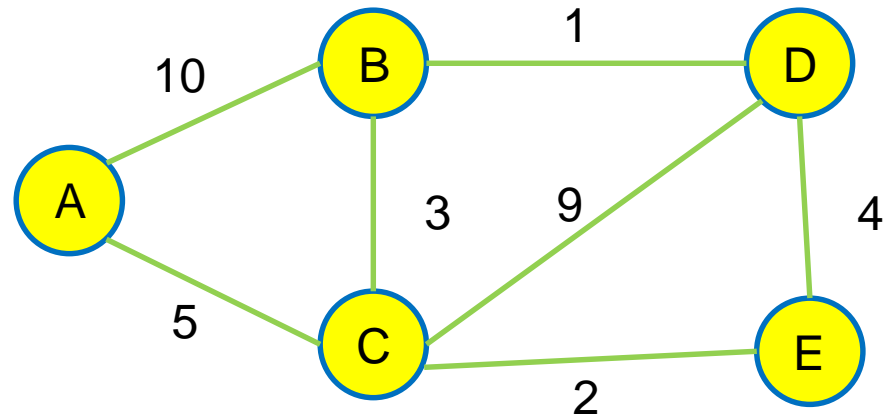
BD	CE	BC	DE	AC	CD	AB
1	2	3	4	5	9	10



# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
  - Take all the edges
  - Sort it
  - Go through the edges one by one
    - Add if u and w not same tree



AB	AC	BC	BD	CD	CE	DE
10	5	3	1	9	2	4

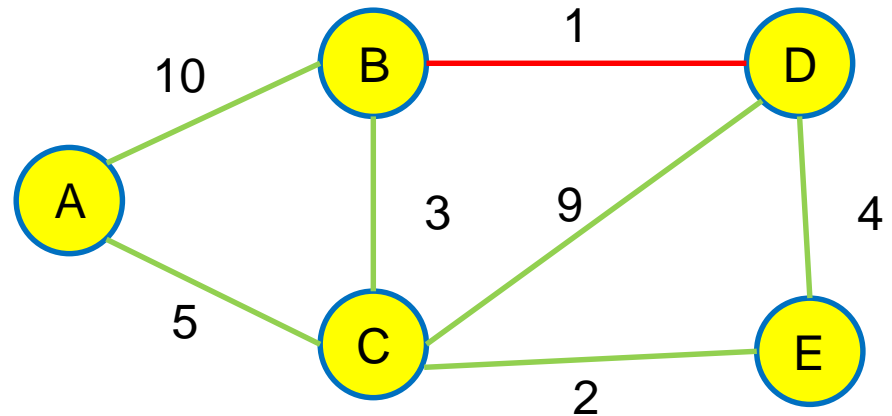
BD	CE	BC	DE	AC	CD	AB
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# Kruskal's Algorithm

## Combining (Union of) Trees

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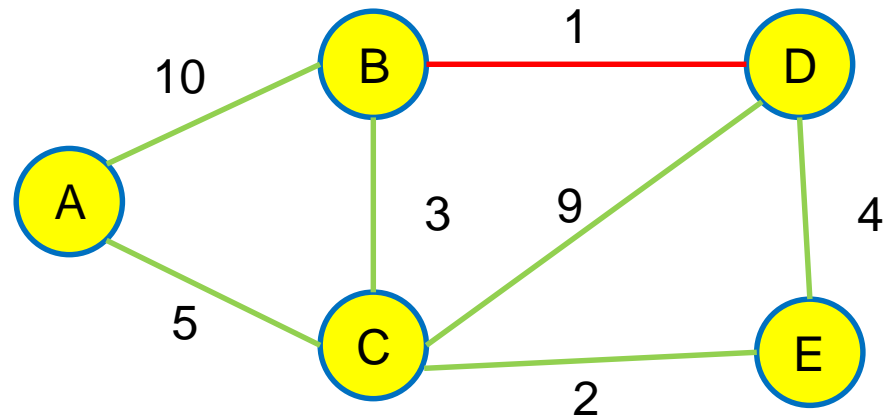
BD	CE	BC	DE	AC	CD	AB
1	2	3	4	5	9	10



# Kruskal's Algorithm

## Combining (Union of) Trees

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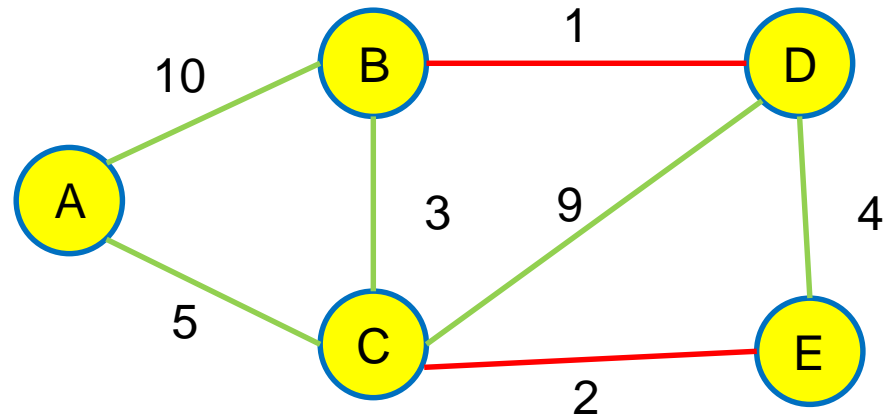
BD	CE	BC	DE	AC	CD	AB
1	2	3	4	5	9	10



# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
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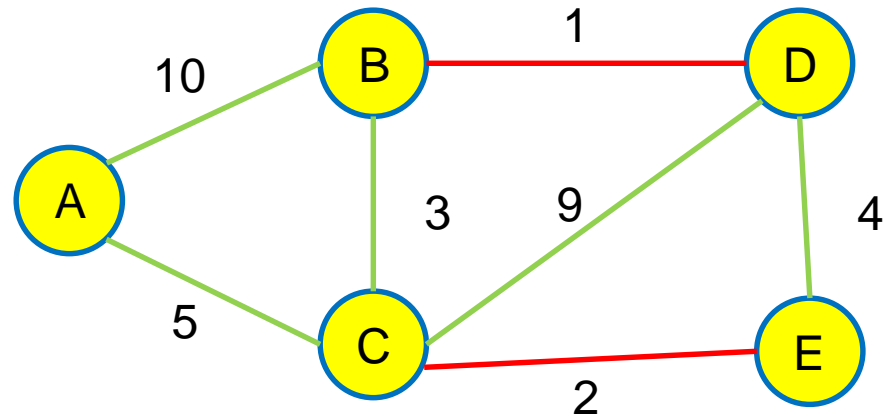
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BD	CE	BC	DE	AC	CD	AB
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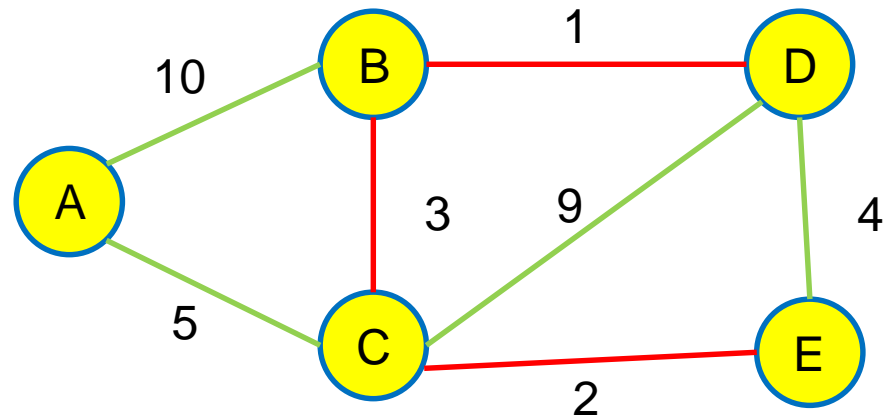




# Kruskal's Algorithm

## Combining (Union of) Trees

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AB	AC	BC	BD	CD	CE	DE
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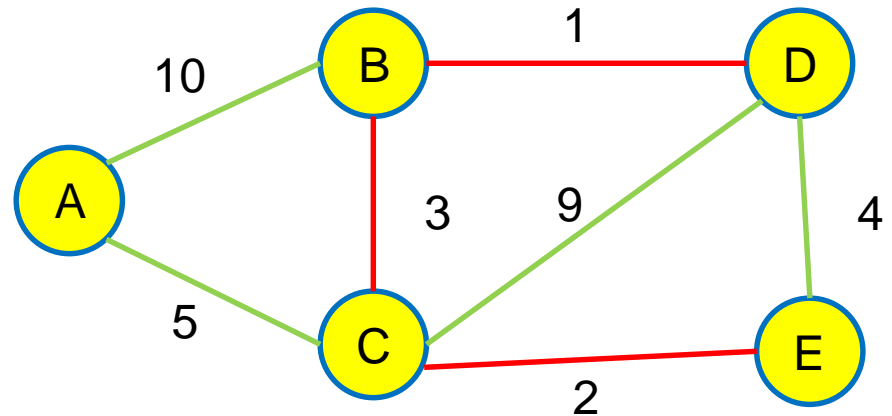
BD	CE	BC	DE	AC	CD	AB
1	2	3	4	5	9	10



# Kruskal's Algorithm

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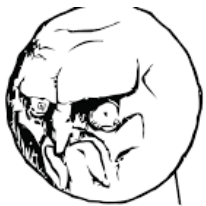
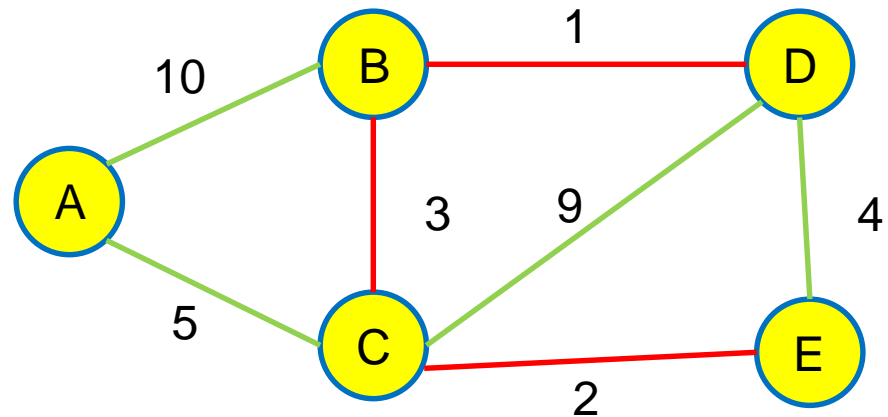
BD	CE	BC	DE	AC	CD	AB
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# Kruskal's Algorithm

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NO.

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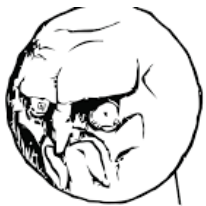
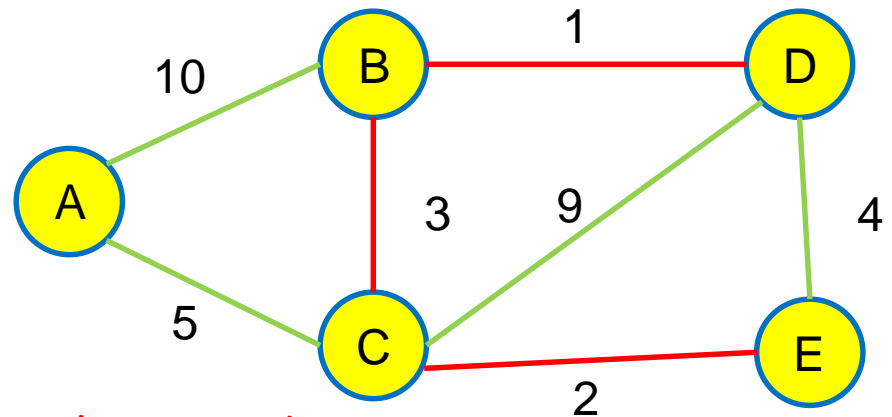
BD	CE	BC	DE	AC	CD	AB
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# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
  - Take all the edges
  - Sort it
  - Go through the edges one by one
    - Add if u and w not same tree. **Don't want cycle**



NO.

AB	AC	BC	BD	CD	CE	DE
10	5	3	1	9	2	4

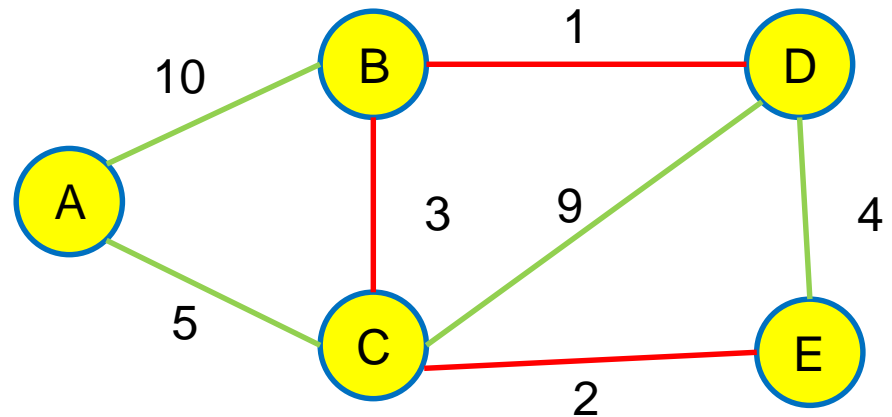
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# Kruskal's Algorithm

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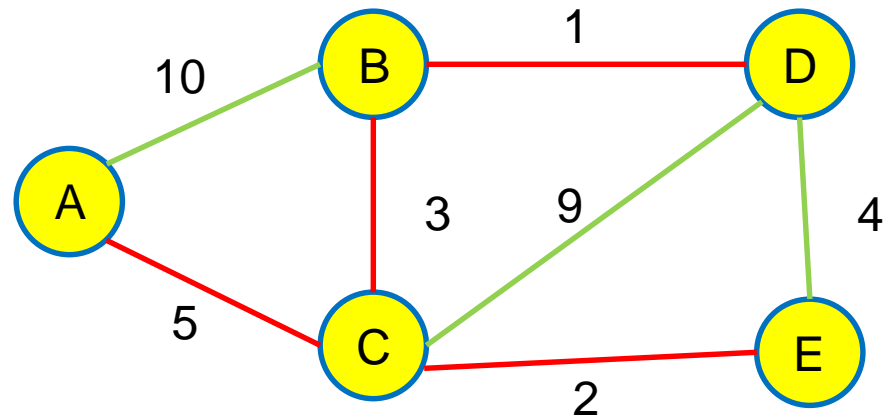
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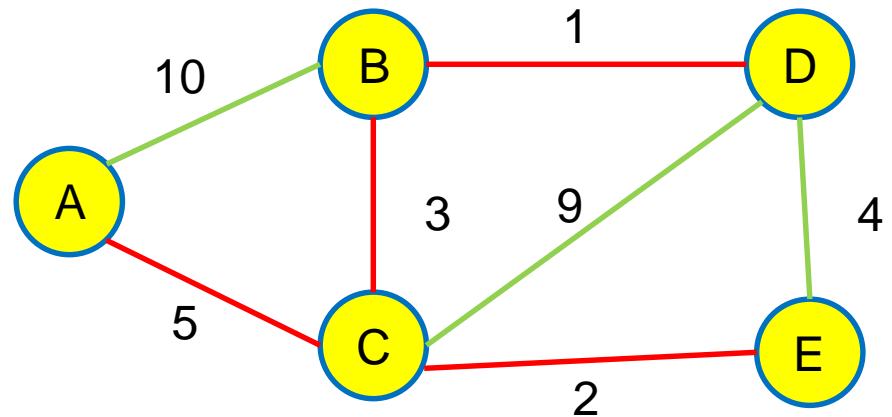
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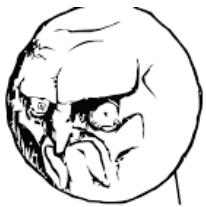
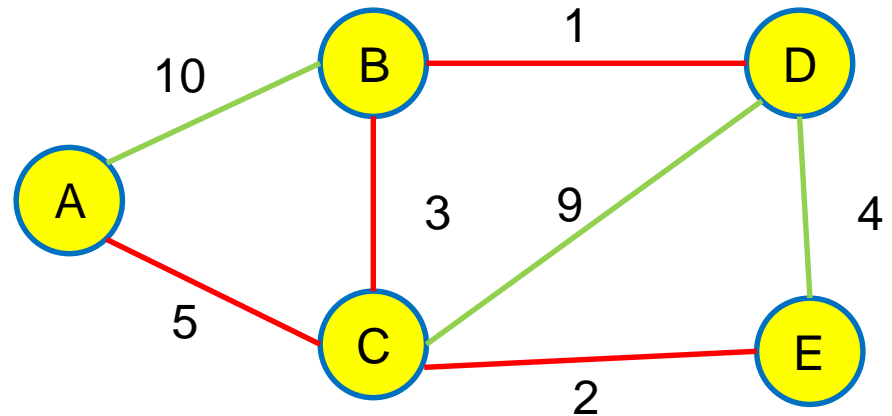
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# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
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NO.

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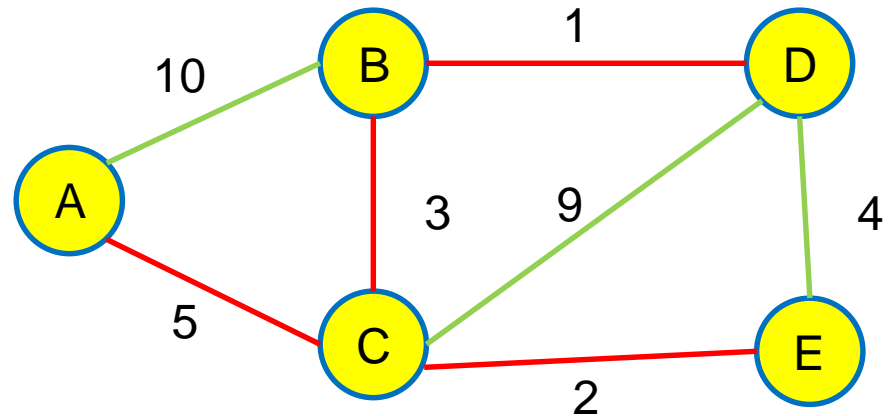




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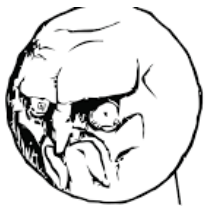
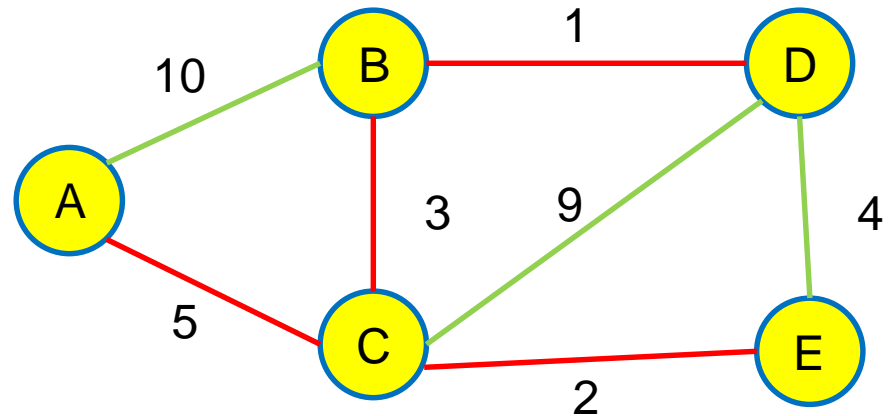
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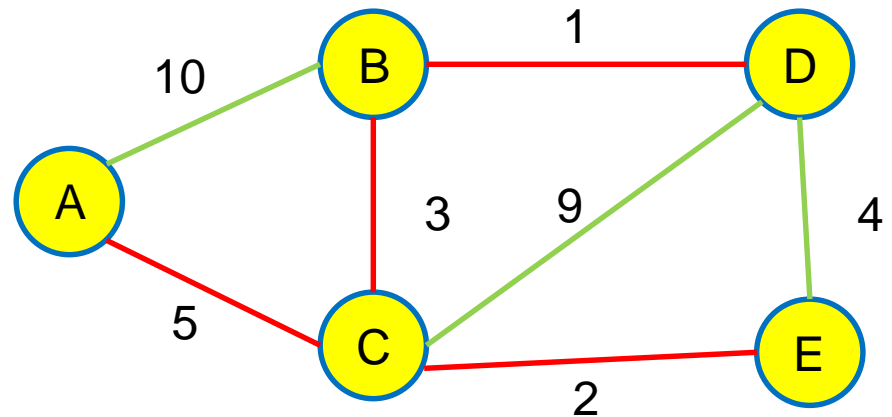
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# Kruskal's Algorithm

## Combining (Union of) Trees

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  - Sort it
  - Go through the edges one by one
    - Add if u and w not same tree
  - And we are done!



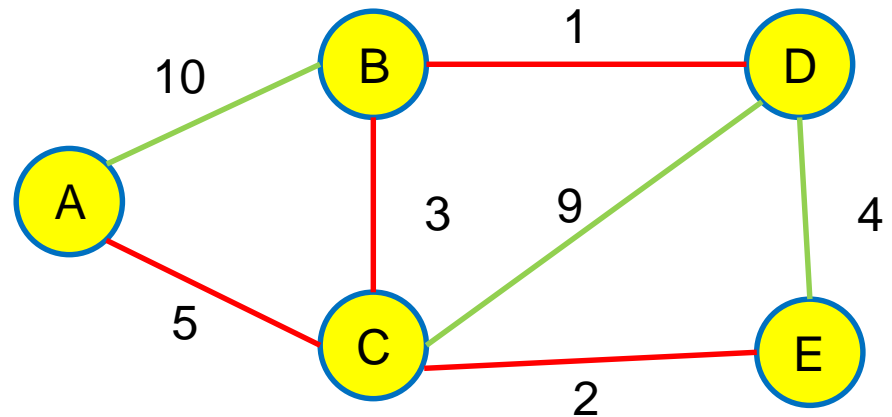
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# Kruskal's Algorithm

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  - Sort it
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    - Add if u and w not same tree
  - And we are done!
  - But how do we implement it?



BD	CE	BC	DE	AC	CD	AB
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# Kruskal's Algorithm

## Combining (Union of) Trees

- Look at the graph
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# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort



# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort
    - Why not Counting or Radix?

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort
  - Check if vertex  $u$  and vertex  $v$  in  $\langle u, v, w \rangle$  is in the same tree

# Kruskal's Algorithm

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    - HOW?

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    - We use set! Any set data structure

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      - Built-in Python Set (which is based on Dictionary/ Hashtable)

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      - Disjoint-Set (which you learn in FIT3155)

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort
  - Check if vertex  $u$  and vertex  $v$  in  $\langle u, v, w \rangle$  is in the same tree (**Find**)
    - HOW?
    - We use set! Any set data structure
      - Built-in Python Set (which is based on Dictionary/ Hashtable)
      - Disjoint-Set (which you learn in FIT3155)
  - If not the same set, you joint them with the edge (**Union**)

# Kruskal's Algorithm

## Combining (Union of) Trees

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  - Take the list of edges and sort.
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  - Check if vertex  $u$  and vertex  $v$  in  $\langle u, v, w \rangle$  is in the same tree (**Find**)
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  - Thus, known as Union-Find



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  - Complexity?

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort
    - This is  $O(E \log E)$
  - Check if vertex  $u$  and vertex  $v$  in  $\langle u, v, w \rangle$  is in the same tree (**Find**)
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    - This is  $O(1)$
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    - This is  $O(V)$  for now
  - Thus, known as Union-Find
  - Complexity?

# Kruskal's Algorithm

## Combining (Union of) Trees

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  - Complexity?

For each edge

# Kruskal's Algorithm

## Combining (Union of) Trees

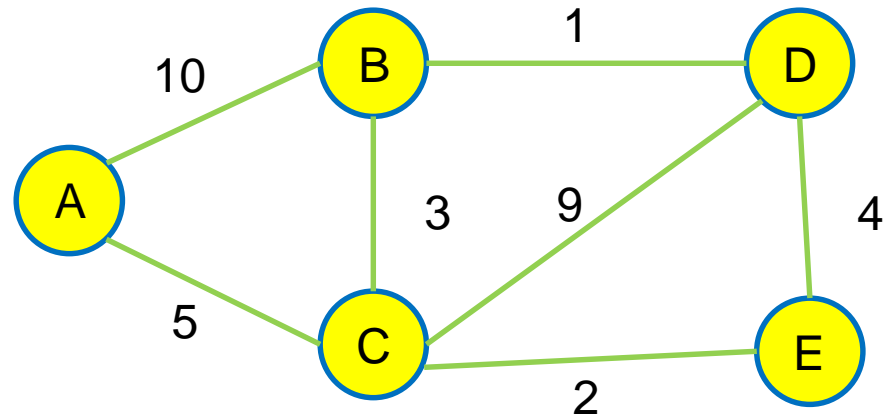
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    - This is  $O(1)$
  - If not the same set, you joint them with the edge (**Union**)
    - This is  $O(V)$  for now
  - Thus, known as Union-Find
  - Complexity?  $O(E \log E + E(1+V)) = O(EV)$

For each edge

# Kruskal's Algorithm

## Combining (Union of) Trees

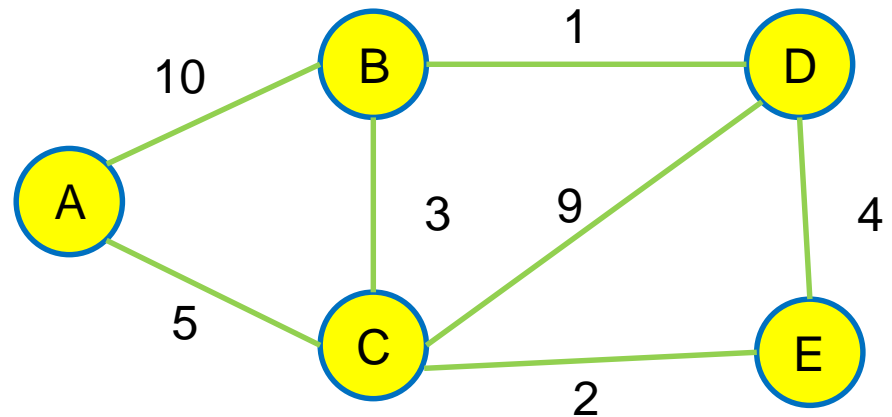
- Union-Find with sets



# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets

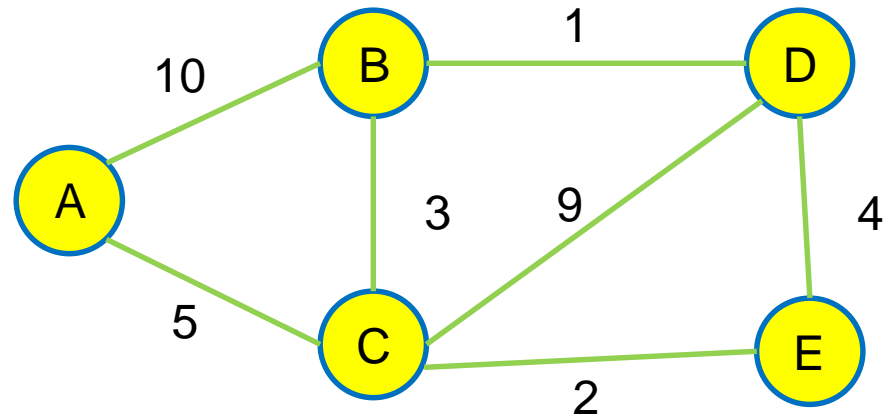


A	B	C	D	E
1	2	3	4	5

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B	C	D	E

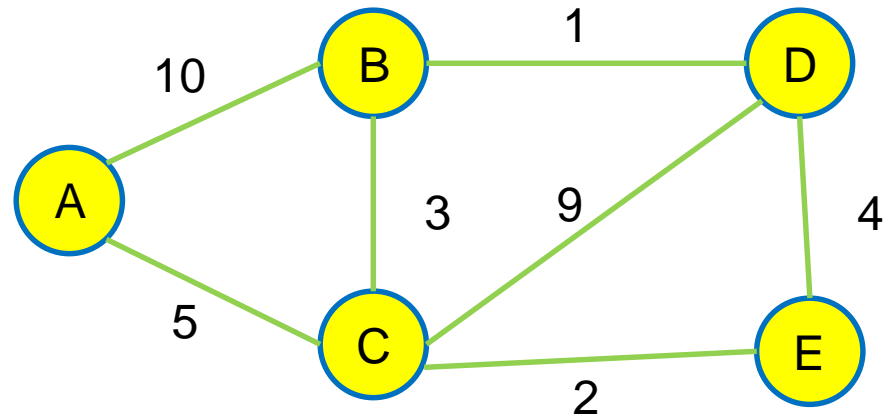
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# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B	C	D	E

Set Array

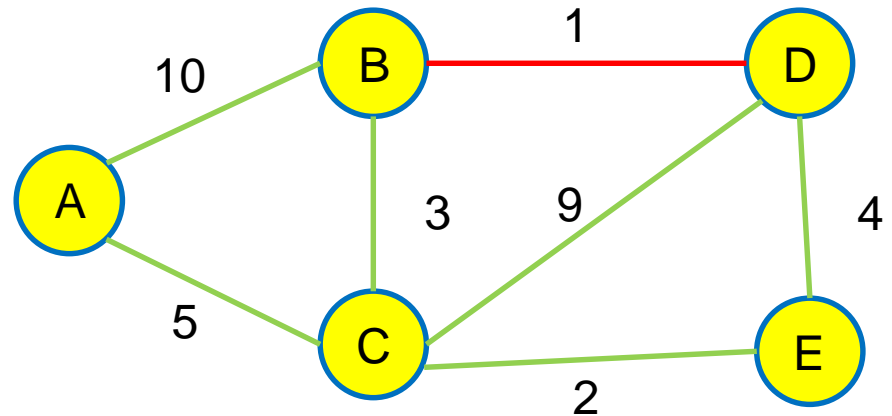
A	B	C	D	E
1	2	3	4	5

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B	C	D	E

Set Array

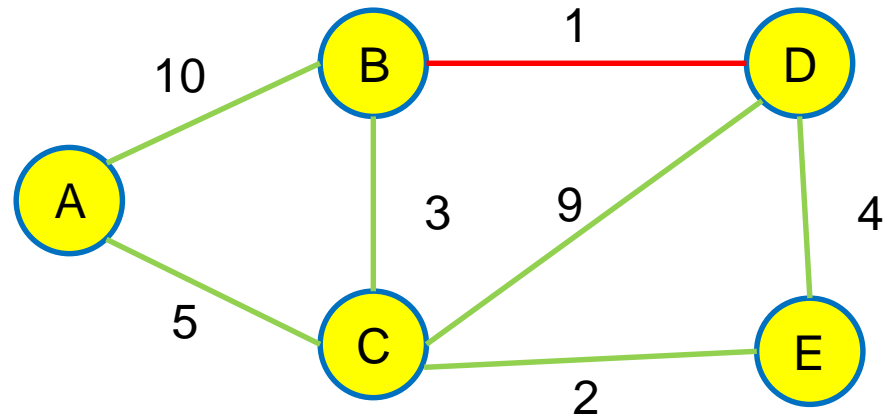
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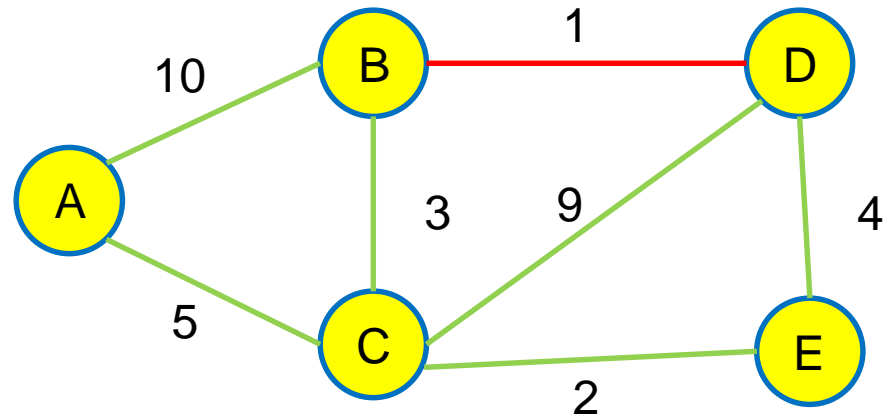
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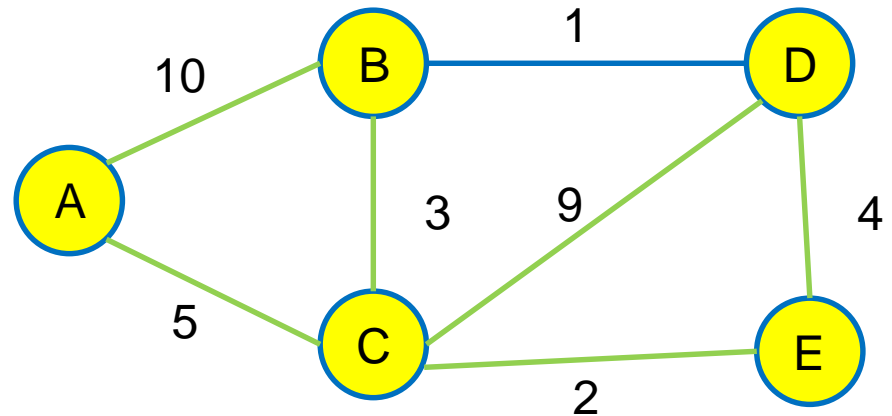
A	B	C	D	E
1	2	3	2	5

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	C		E

Set Array

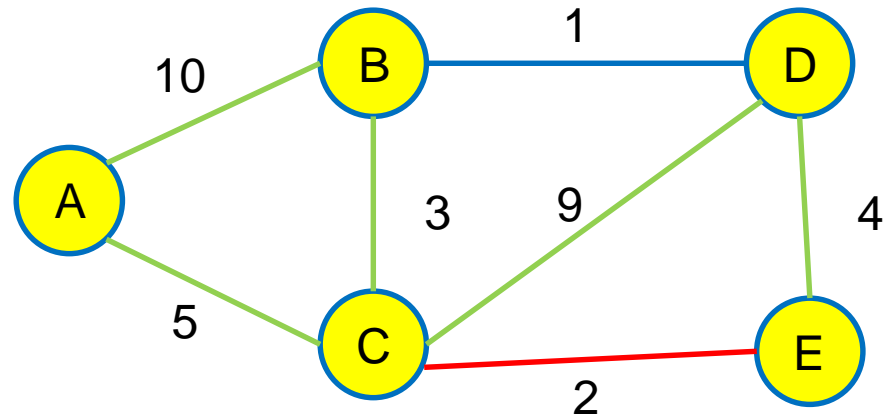
A	B	C	D	E
1	2	3	2	5

Map Array

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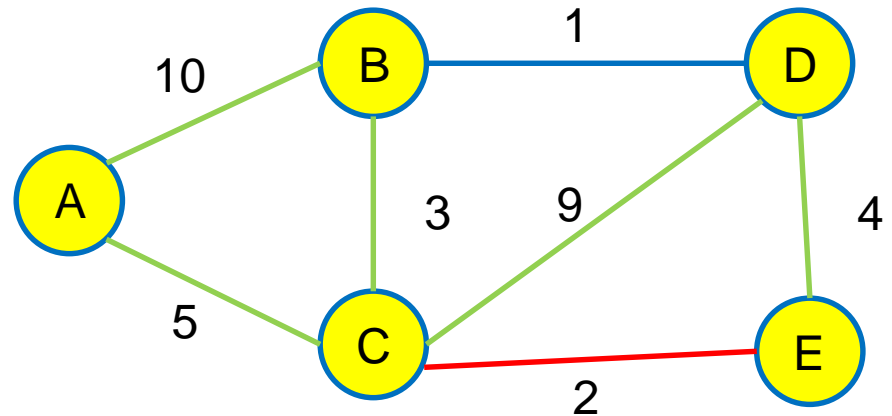
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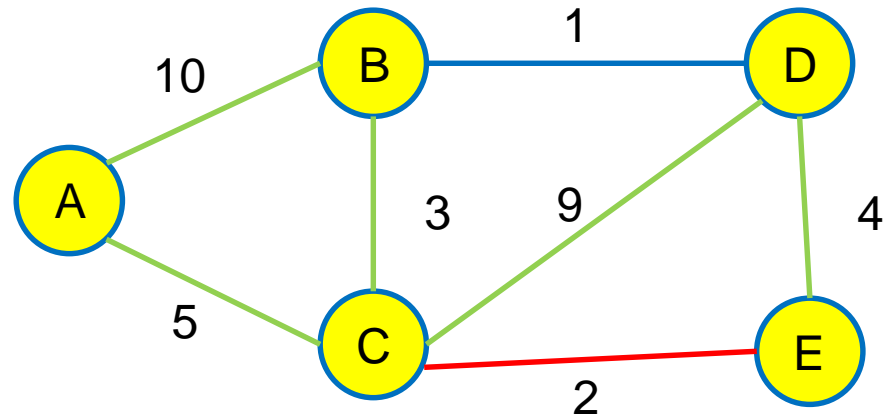
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Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	C,E		E

Set Array

A	B	C	D	E
1	2	3	2	3

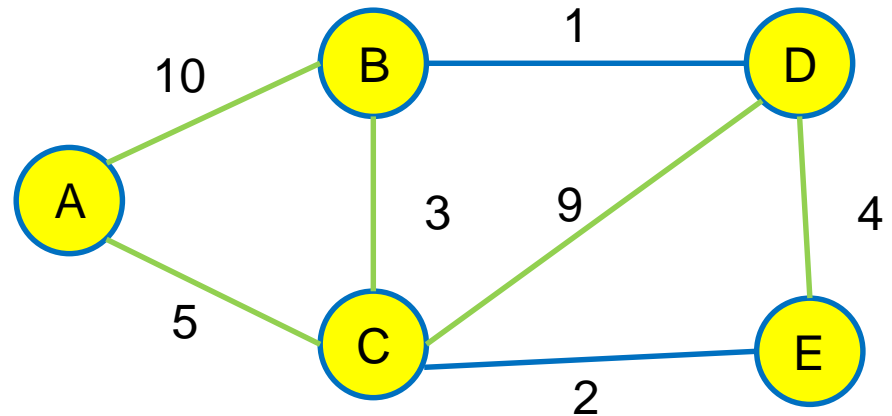
Map Array



# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	C,E		

Set Array

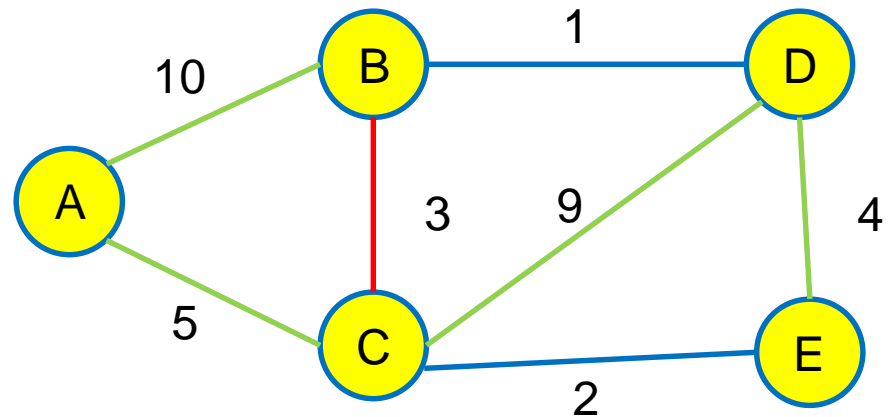
A	B	C	D	E
1	2	3	2	3

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	C,E		

Set Array

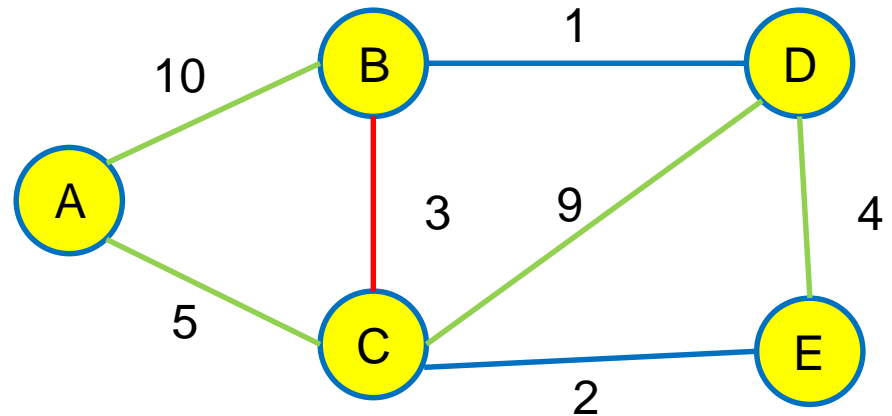
A	B	C	D	E
1	2	3	2	3

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	C,E		

Set Array

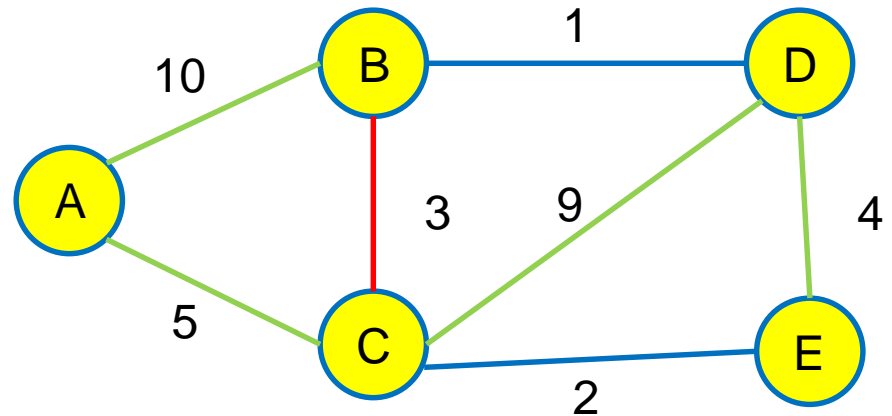
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Map Array

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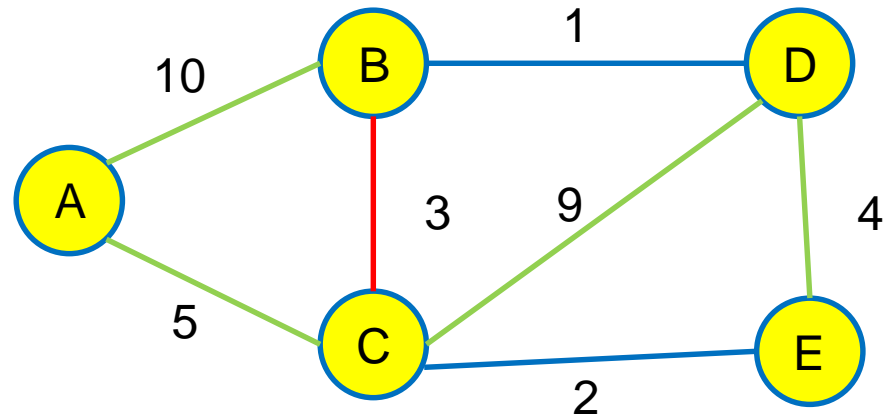
A	B	C	D	E
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Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets



1	2	3	4	5
A	B,D	<u>C</u> ,E		

Set Array

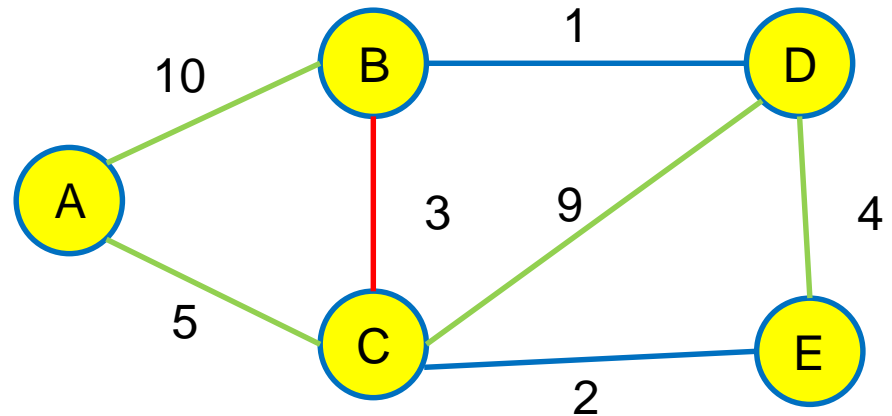
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Set Array

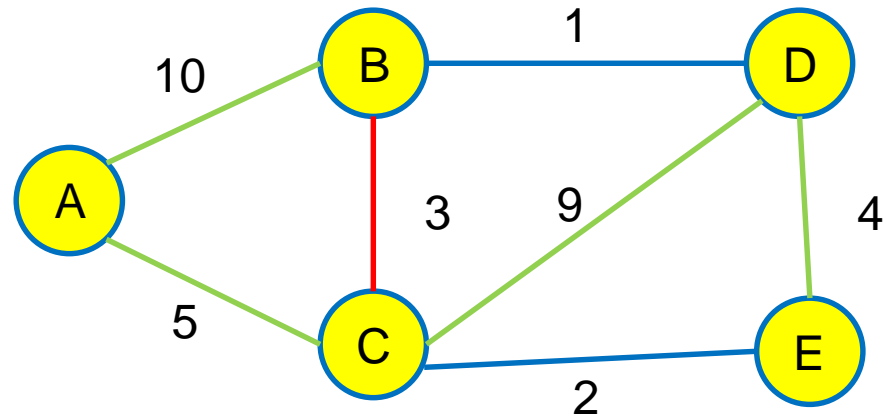
A	B	C	D	E
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Map Array

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- Union-Find with sets



1	2	3	4	5
A	B,D,C,E			

Set Array

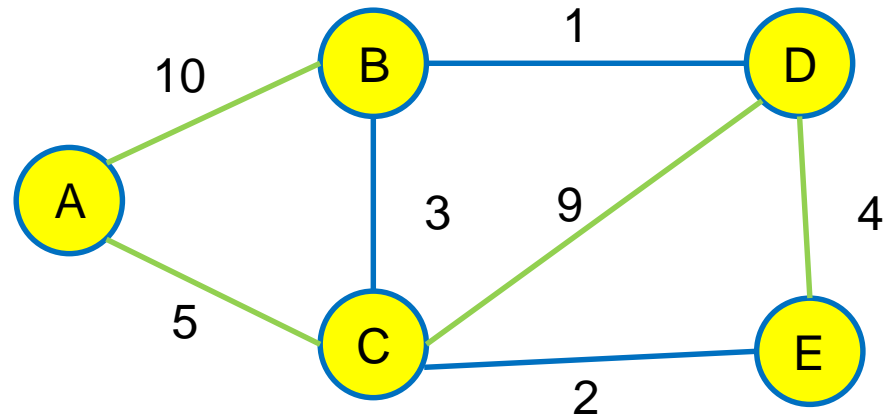
A	B	C	D	E
1	2	2	2	2

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

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1	2	3	4	5
A	B,D,C,E			

Set Array

A	B	C	D	E
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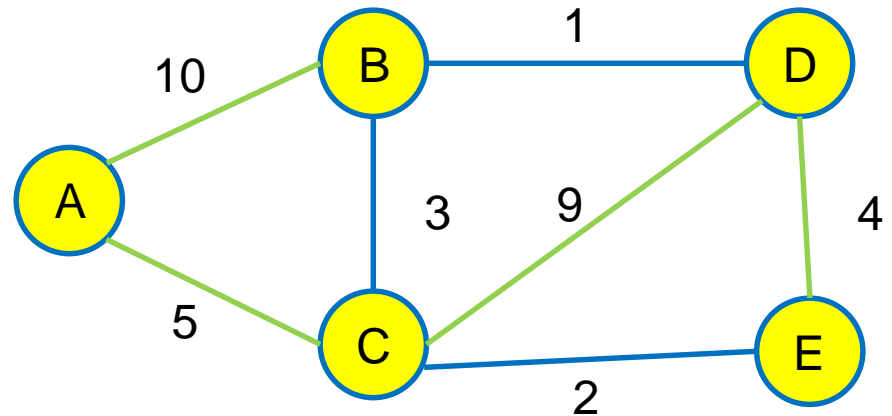
Map Array



# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets  
... and so on  
you get the idea...



1	2	3	4	5
A	B,D,C,E			

Set Array

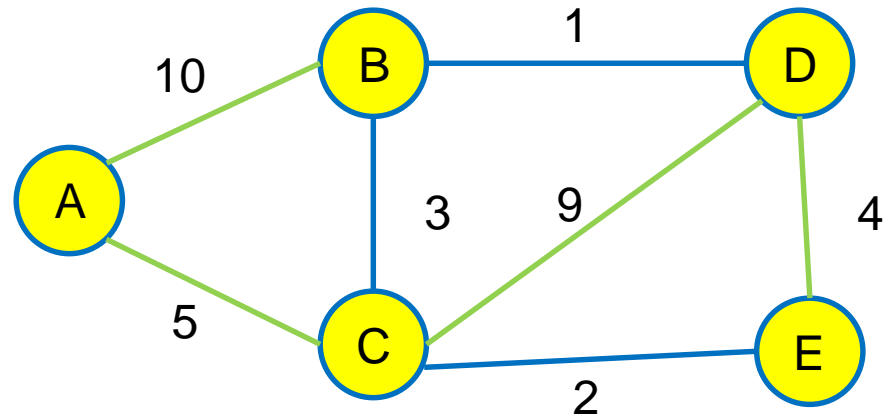
A	B	C	D	E
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Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets
  - Check the set for vertex
  - Merge vertex set
    - Smaller set -> bigger set
    - Update the map array...



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A	B,D,C,E			

Set Array

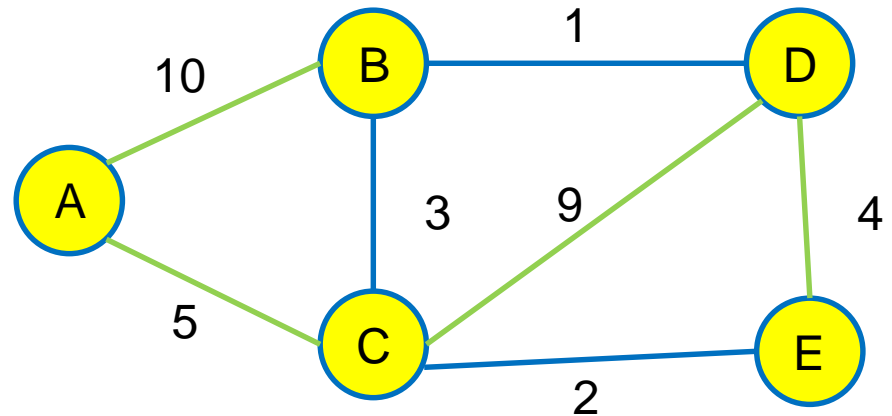
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Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- Union-Find with sets
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  - Merge vertex set
    - Smaller set -> bigger set
    - Update the map array...
  - Repeat...



1	2	3	4	5
A	B,D,C,E			

Set Array

A	B	C	D	E
1	2	2	2	2

Map Array

# Kruskal's Algorithm

## Combining (Union of) Trees

- But how do we implement it?
  - Take the list of edges and sort.
    - Easy... just use quicksort
    - This is  $O(E \log E)$
  - Check if vertex  $u$  and vertex  $v$  in  $\langle u, v, w \rangle$  is in the same tree (**Find**)
    - We use set! Any set data structure
      - Built-in Python Set (which is based on Dictionary/ Hashtable)
      - Disjoint-Set (which you learn in FIT3155)
    - This is  $O(1)$
  - If not the same set, you joint them with the edge (**Union**)
    - This is  $O(V)$  for now
  - Thus, known as Union-Find
  - Complexity?  $O(EV)$  but this is  $O(E \log V)$  amortized

For each edge

# Kruskal's Algorithm

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  - Thus, known as Union-Find
  - Complexity?  $O(EV)$  but this is  $O(E \log V)$  amortized (worst case merge 2 same size)

For each edge

Questions?

- This is a week of content itself for FIT3155
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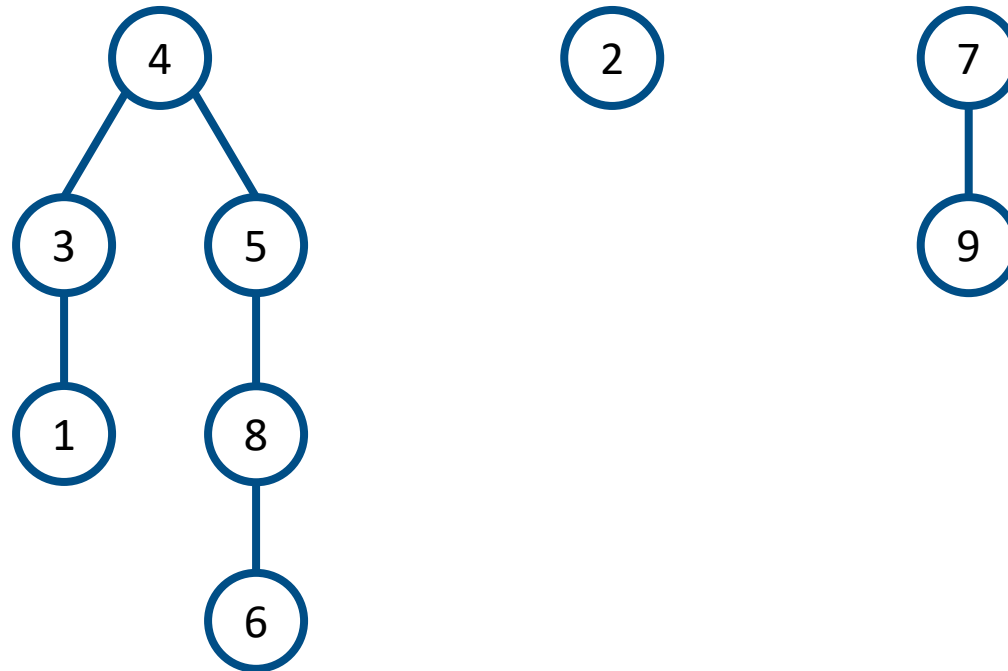
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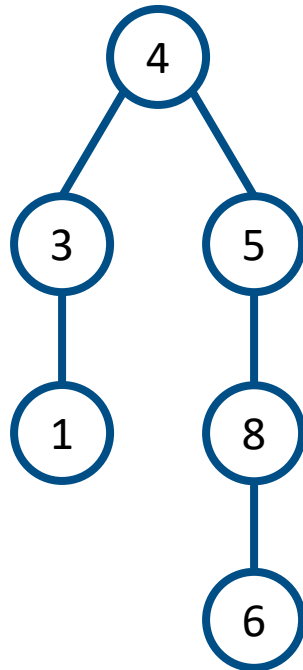
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  - Size or height, as negative value

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  - Though, probably the shortest and easiest one to learn
- Union by size
- Union by height/ rank
- Done by using an array, called the parent array
  - Index of the parent, as positive value
  - Size or height, as negative value but only at the **root**

# Kruskal's Union-Find



# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Why such an implementation?

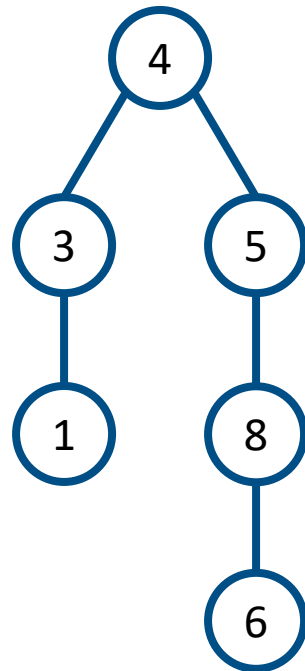
- Why such an implementation?
  - On find( $u$ )
    - Loop till we reach the root of  $u$  (having negative number)



- Why such an implementation?
  - On find( $u$ )
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- Why such an implementation?
  - On find(u)
    - Loop till we reach the root of u (having negative number)
  - On find(v)
    - Loop till we reach the root of v (having negative number)
  - Remember: roots always store the size (as a negative number)

# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
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  - If both u and v have the same root...
    - They are in the same team/ set/ tree

# Kruskal's

## Union-Find

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    - We can't perform union( $u, v$ )



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  - If both  $u$  and  $v$  have the same root...
    - They are in the same team/ set/ tree
    - We can't perform  $\text{union}(u, v)$
  - If both  $u$  and  $v$  have different root...
    - They are in different team/ set/ tree



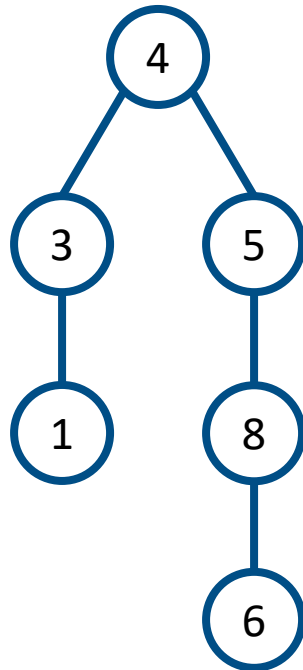


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  - If both  $u$  and  $v$  have the same root...
    - They are in the same team/ set/ tree
    - We can't perform union( $u, v$ )
  - If both  $u$  and  $v$  have different root...
    - They are in different team/ set/ tree
    - Then we can perform union( $u, v$ )

- Why such an implementation?
  - On find( $u$ )
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  - On find( $v$ )
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  - If both  $u$  and  $v$  have the same root...
    - They are in the same team/ set/ tree
    - We can't perform union( $u, v$ )
  - If both  $u$  and  $v$  have different root...
    - They are in different team/ set/ tree
    - Then we can perform union( $u, v$ )
    - If tree with  $u$  has more items than tree with  $v$ ,  
root of  $u$  becomes parent of root of  $v$
    - ... vice versa

Questions?

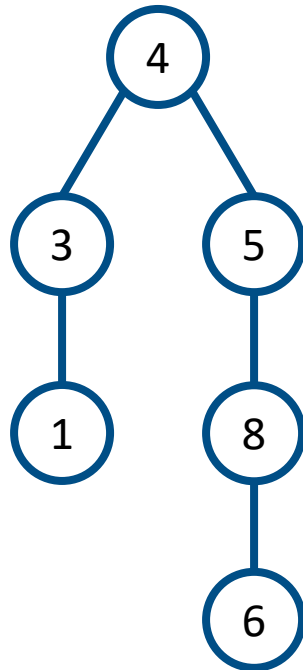
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

– Union(3,8)

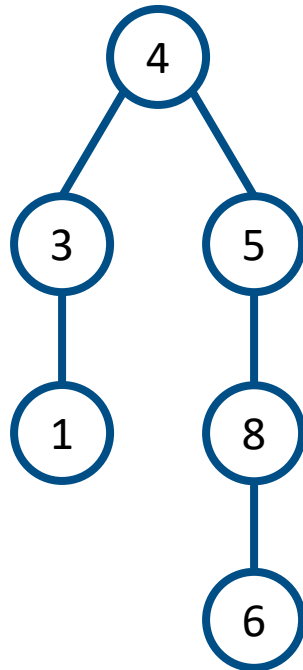
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(3,8)
  - Find(3)
  - Find(8)

# Kruskal's Union-Find

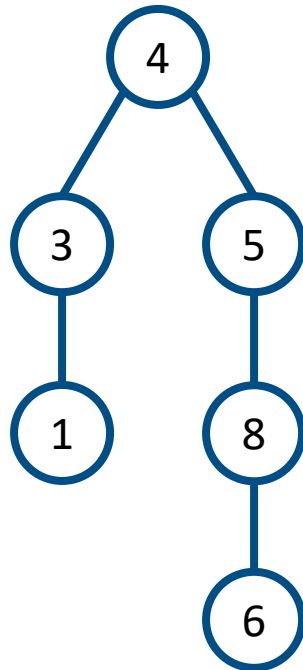


	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

– Union(3,8)

▪ Find(3) -> 4

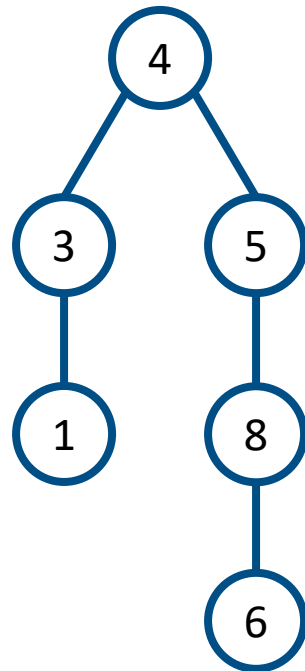
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(3,8)
  - Find(3) -> 4
  - Find(8) -> 4

# Kruskal's Union-Find



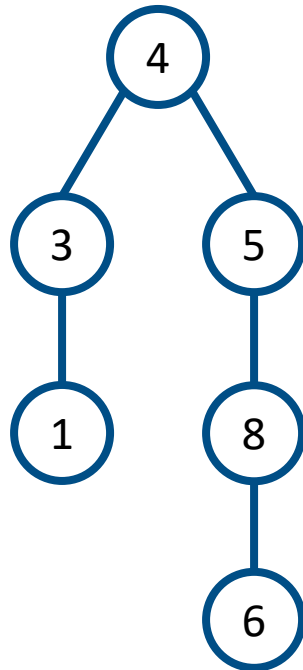
	1	2	3	4	5	6	7	8	9
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- Union(3,8), **can't perform the union**
  - Find(3) -> 4
  - Find(8) -> 4



Questions?

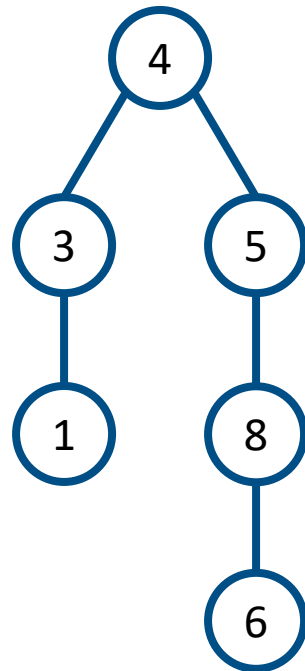
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
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– Union(9,8)

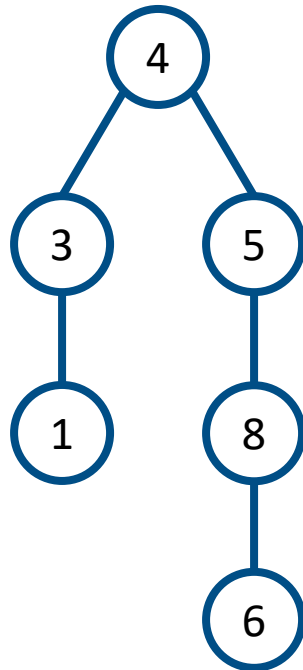
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(9,8)
  - Find(9)

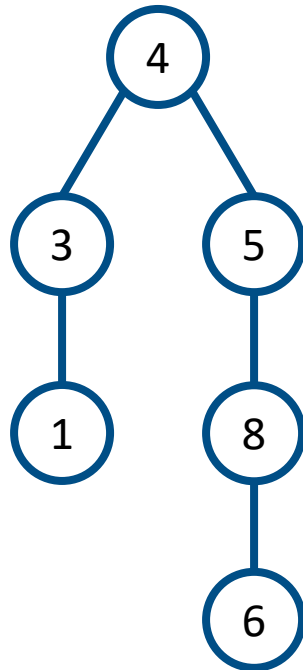
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(9,8)
  - Find(9) -> 7

# Kruskal's Union-Find

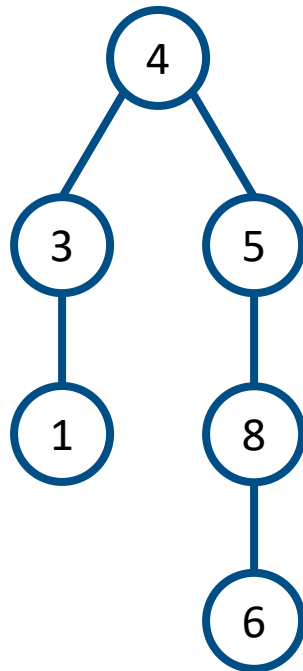


	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(9,8)
  - Find(9) -> 7
  - Find(8)

# Kruskal's

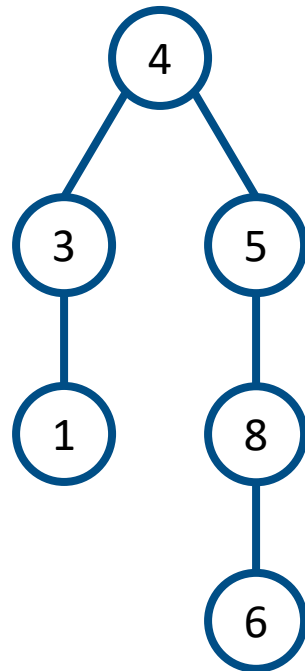
## Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(9,8)
  - Find(9) -> 7
  - Find(8) -> 4

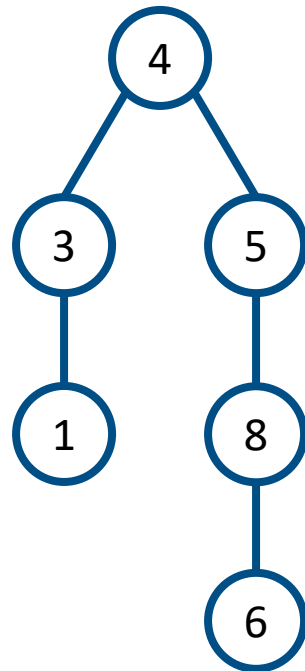
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-6	4	8	-2	5	7

- Union(9,8), different tree so we can perform union
  - Find(9) -> 7
  - Find(8) -> 4

# Kruskal's Union-Find

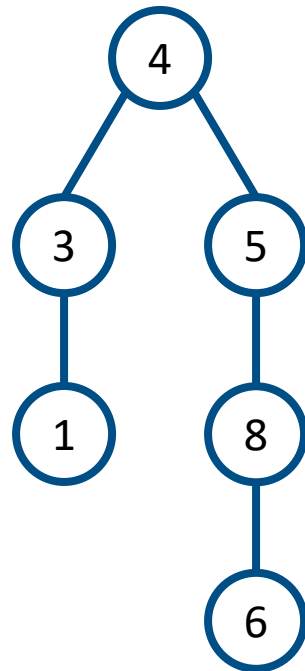


	1	2	3	4	5	6	7	8	9
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- Union(9,8), different tree so we can perform union
  - Find(9) -> 7, size of 2
  - Find(8) -> 4,



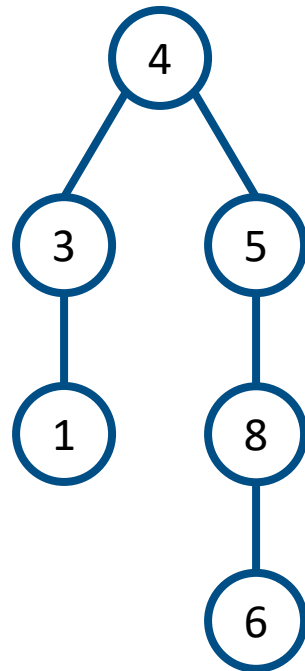
# Kruskal's Union-Find



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- Union(9,8), different tree so we can perform union
  - Find(9) -> 7, size of 2
  - Find(8) -> 4, size of 6

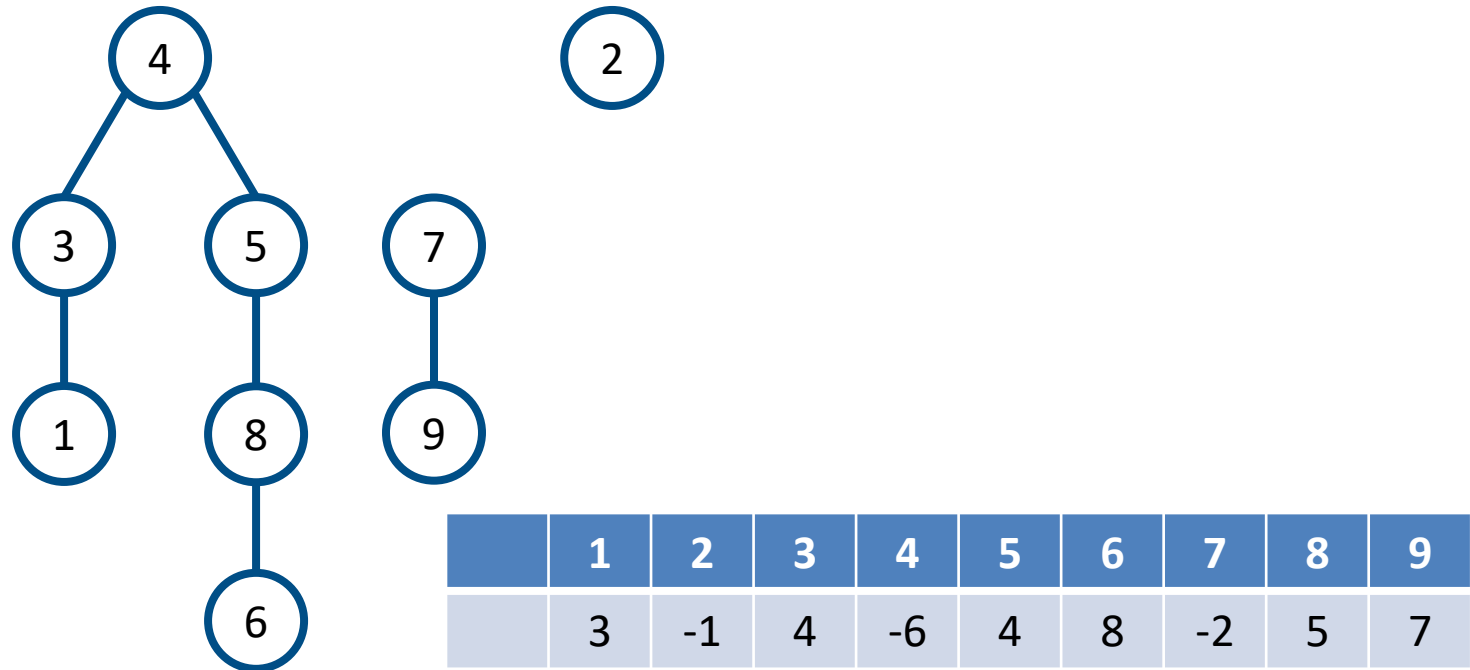
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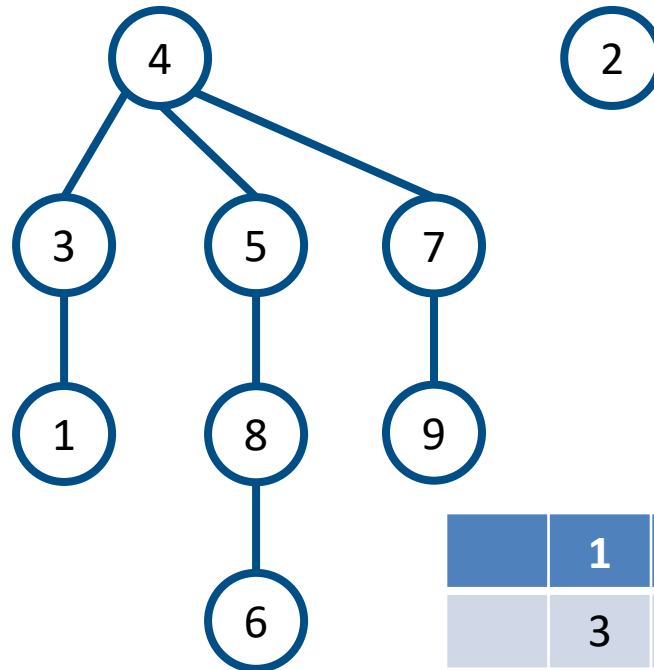
- Union(9,8), **different tree so we can perform union**
  - Find(9) -> 7, size of 2, smaller tree so merge to bigger tree
  - Find(8) -> 4, size of 6

# Kruskal's Union-Find



- Union(9,8), different tree so we can perform union
  - Find(9) -> 7, size of 2, smaller tree so merge to bigger tree
  - Find(8) -> 4, size of 6

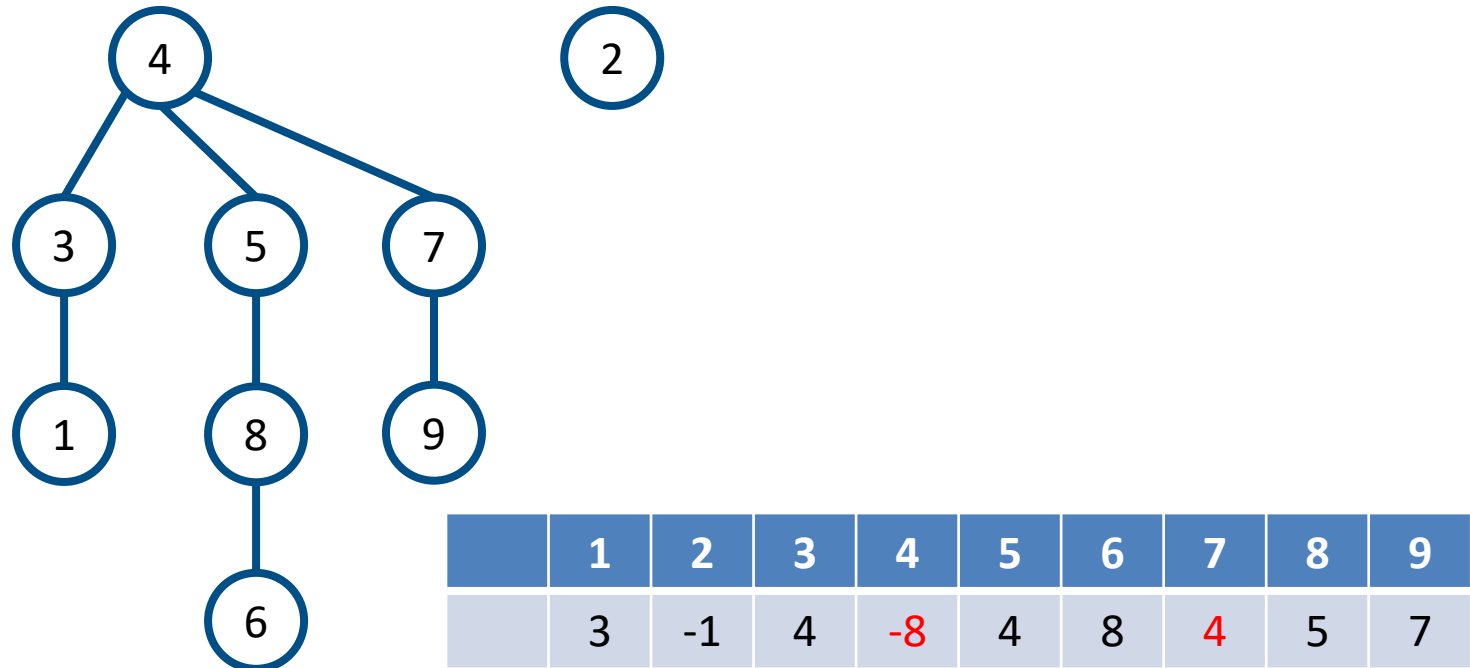
# Kruskal's Union-Find



	1	2	3	4	5	6	7	8	9
	3	-1	4	-8	4	8	4	5	7

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  - Find(9) -> 7, size of 2, smaller tree so merge to bigger tree
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- Time to prove it on the whiteboard...
  - Known as proof by contradiction...



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  - **Invariant: The selected edges will be part of the final MST**

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Thank You