



Department of Computer Science and Engineering

# Data Structures and Object-Oriented Design

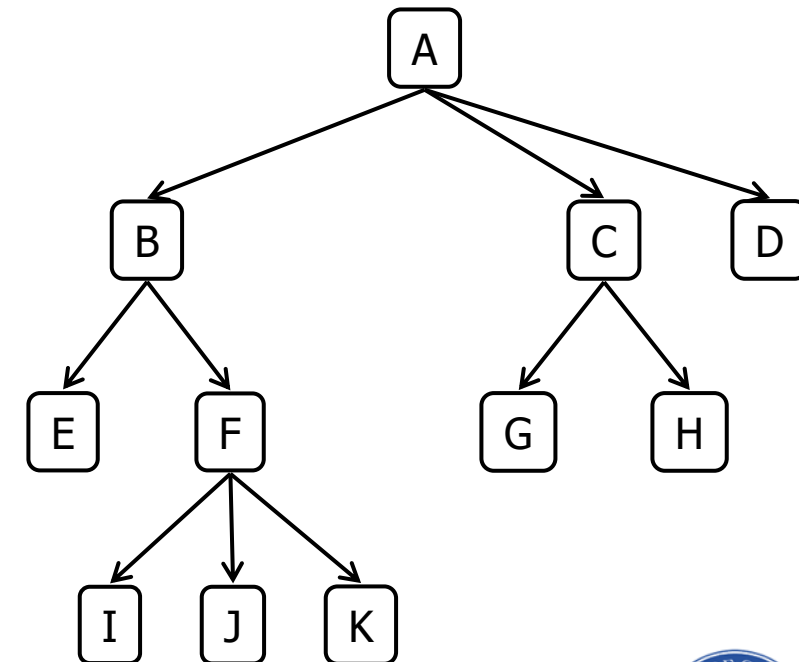
(CSE – 2050)

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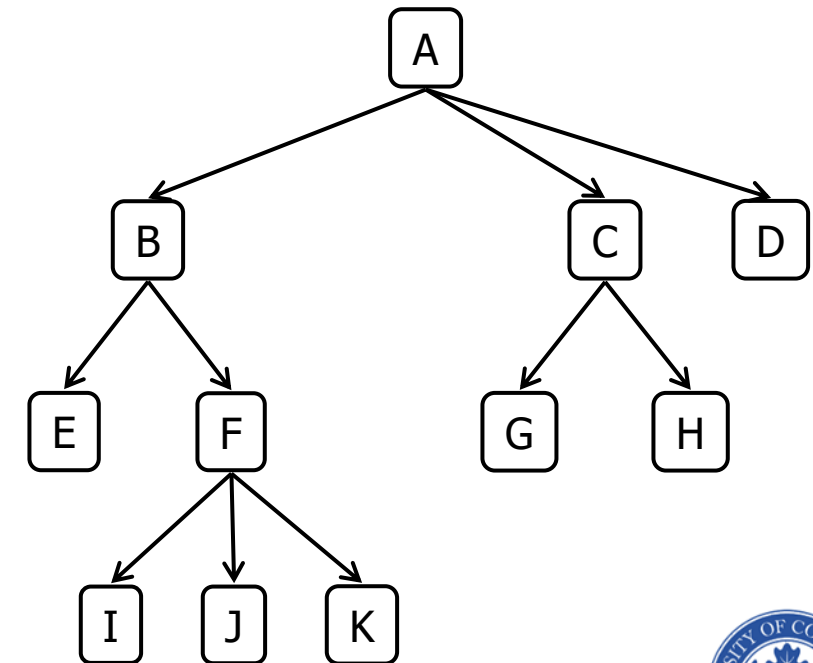
## Module 9 – Trees

- **Root:** Highest-most node without parent (A)
- **Edge:** Connection between two nodes to show a relationship between them
- **Path:** A path is an ordered list of nodes that are connected by edges (from top to bottom)
- **Parent:** A node is a parent of all nodes it connects to with outgoing edges
- **Children:** The set of nodes which have incoming edges from a parent node
- **Sibling:** Nodes that are children of the same parent



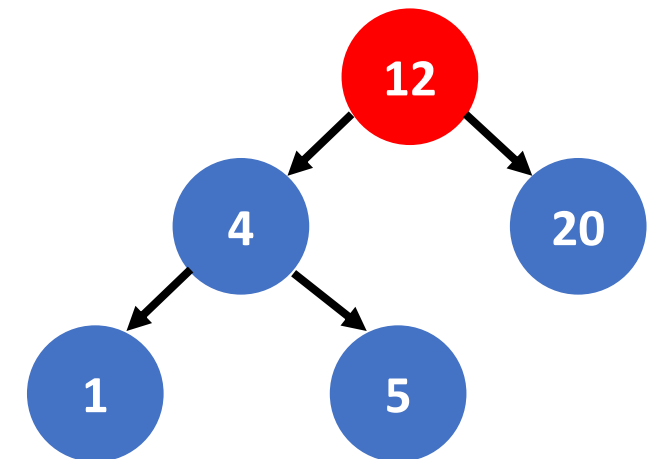
## Module 9 – Trees

- **Descendant** of node (x): all nodes for which there is path from x. (child, grandchild, grand-grandchild)
- **Ancestors** of node (x): all nodes which x is a descendant of (parent, grandparent, grand-grandparent)
- **Leaf Node**: Nodes which have no children (J, K, etc)
- **Subtree**: Set of nodes and edges comprised of a parent and all descendants of that parent (C-G-H)
- **Degree** of a node: The number of its children
- **Degree** of a tree: Total number of nodes in it



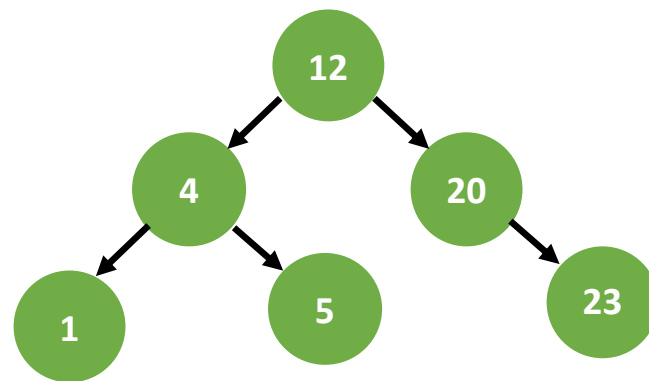
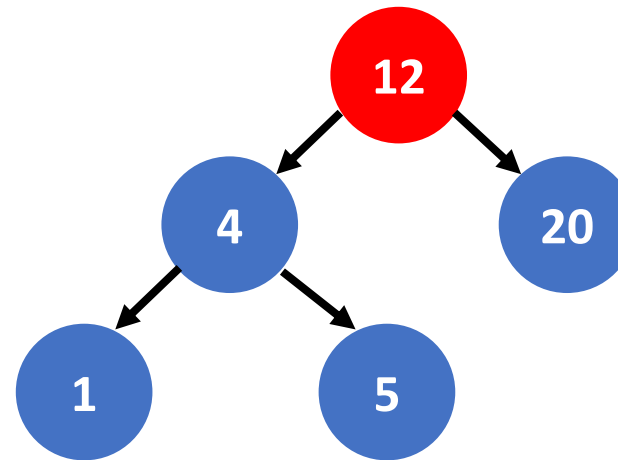
## Module 9 – Trees

- Binary search trees
- Every node in the tree can have at most 2 children (left child and right child)
  - left child is smaller than the parent node
  - right child is greater than the parent node

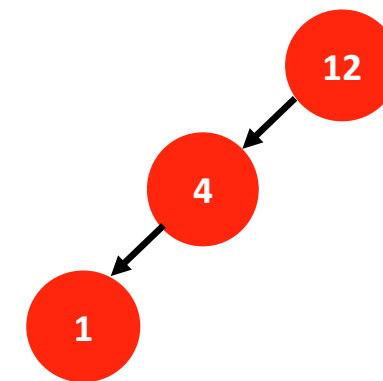


- The new data is placed in sorted order so that the search and other operations can use the principle of binary search with  $O(\log n)$  running time

## Module 9 – Trees



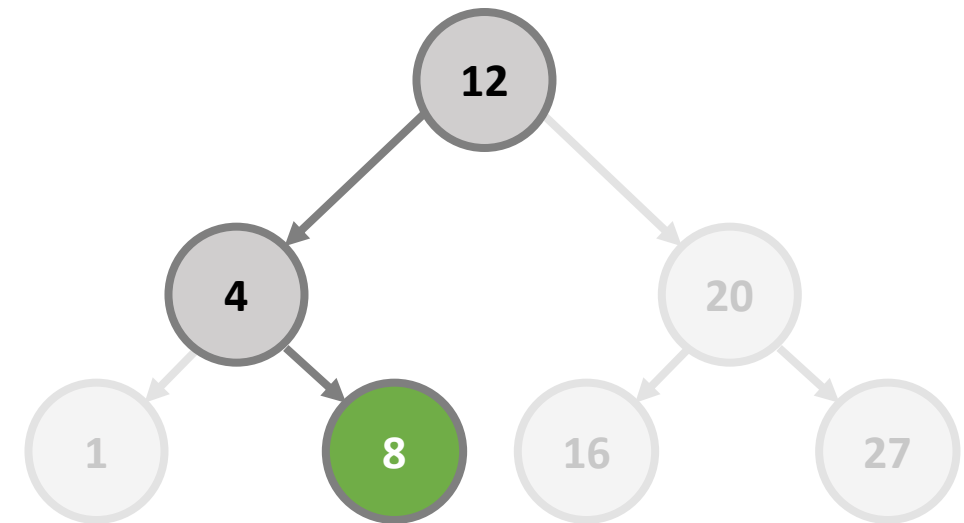
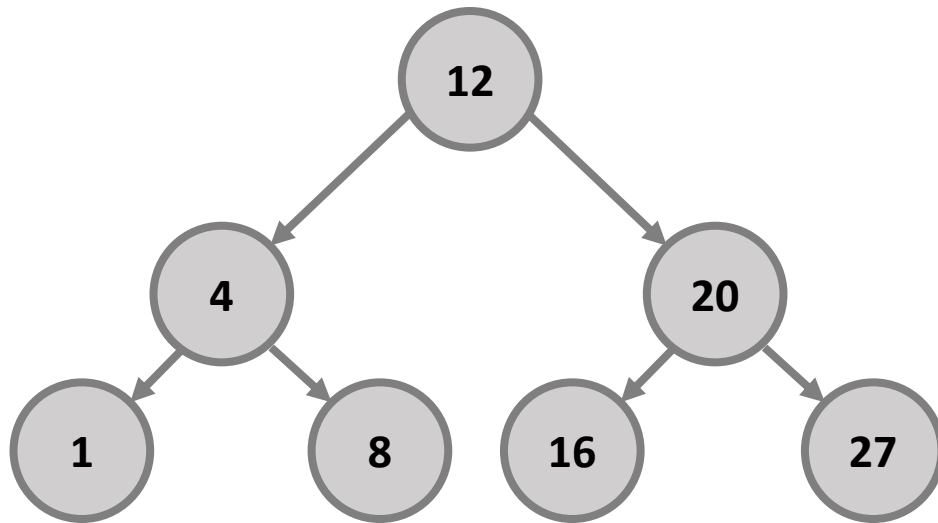
BALANCED TREE



IMBALANCED TREE

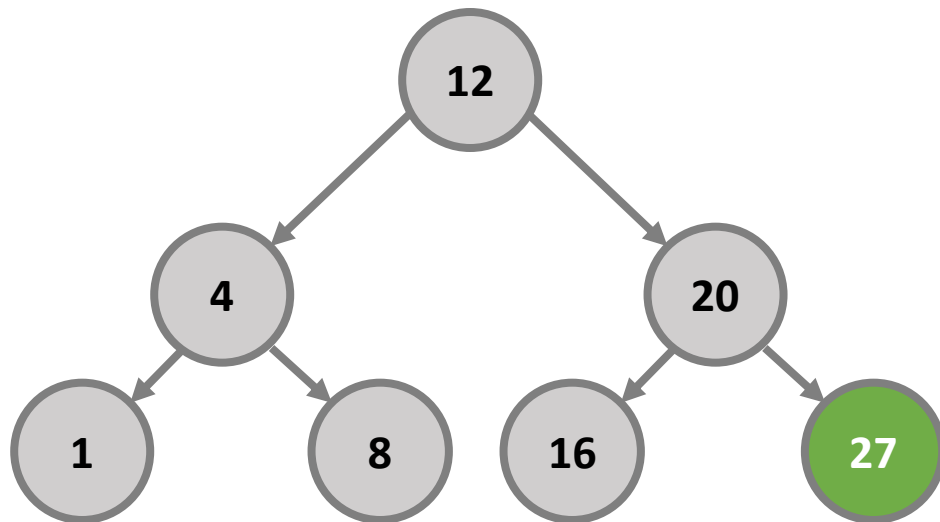
## Module 9 – Trees

Search(8)



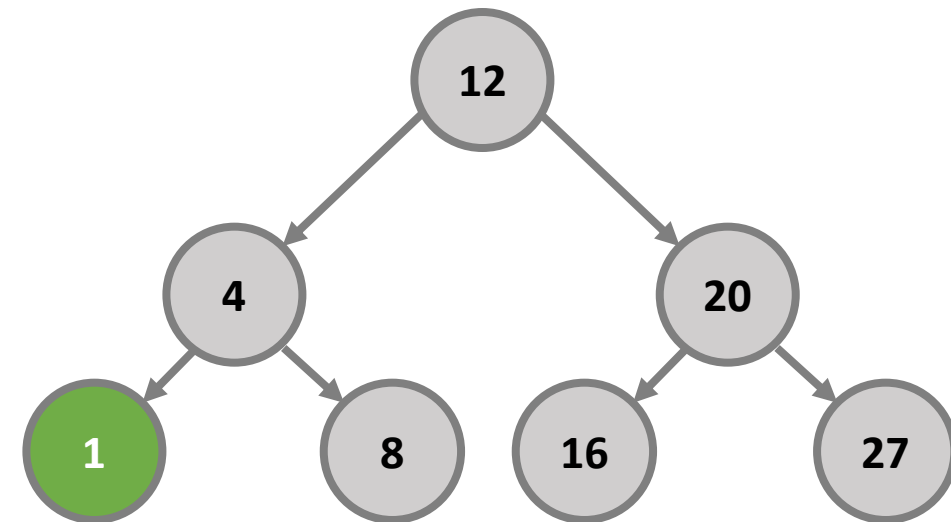
## Module 9 – Trees

Search max()



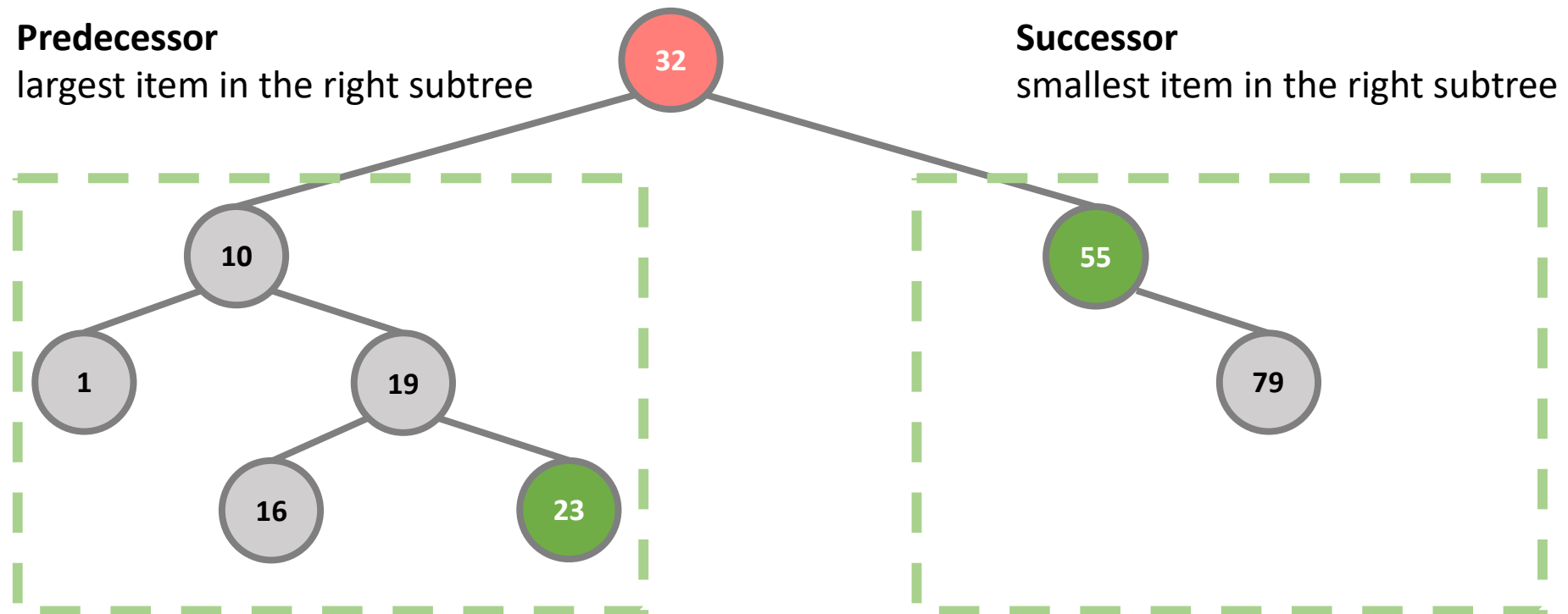
the **maximum** item in the binary search tree is the **rightmost** item in the tree

Search min()



the **minimum** item in the binary search tree is the **leftmost** item in the tree

## Module 9 – Trees





## Module 9 – Trees

**Tree traversal approaches****Pre-order**

- Root node → left subtree → right subtree

32, 10, 1, 19, 16, 23, 55, 79

**Post-order**

- Left subtree → Right subtree → Root node

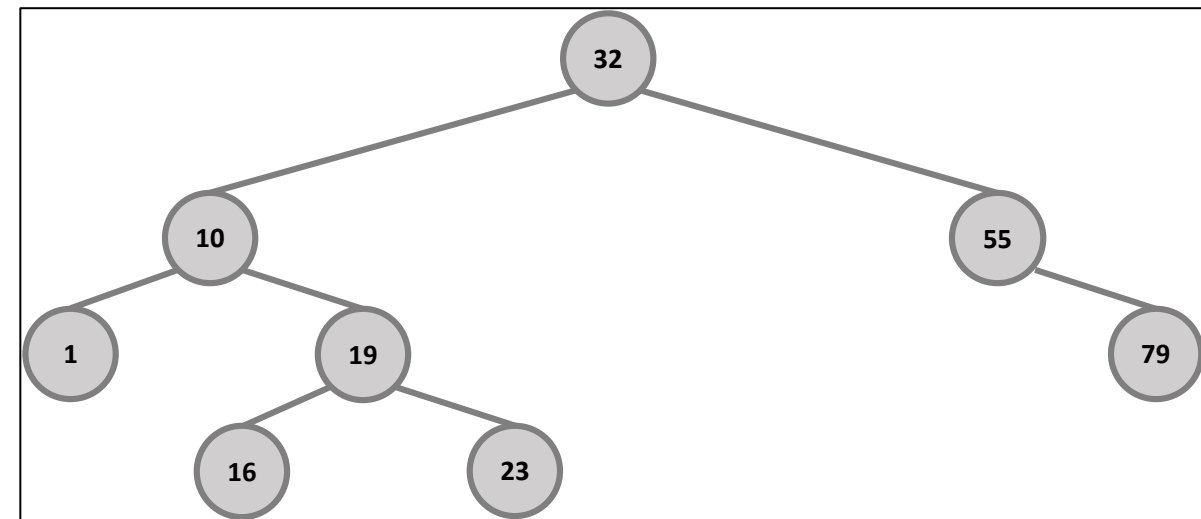
1, 16, 23, 19, 10, 79, 55, 32

**In-order**

- Left subtree → Root node → Right subtree

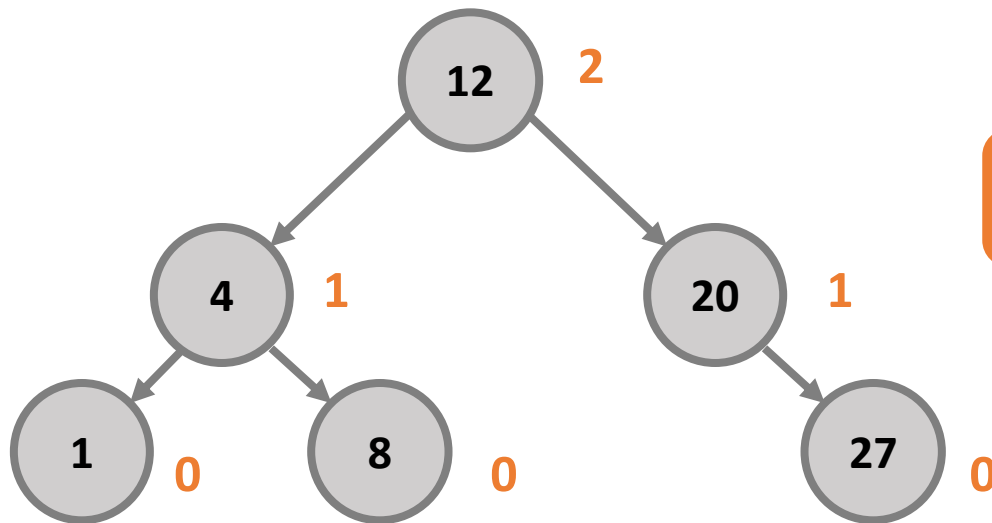
1, 10, 16, 19, 23, 32, 55, 79

- Returns elements in sorted order



## Module 9 – Trees

- To determine whether the tree is balanced or not, we have to measure its **height** first and then calculate the **balance factor**
- Height of a tree (or a node) is the longest path from the root (or from the node) to a leaf node

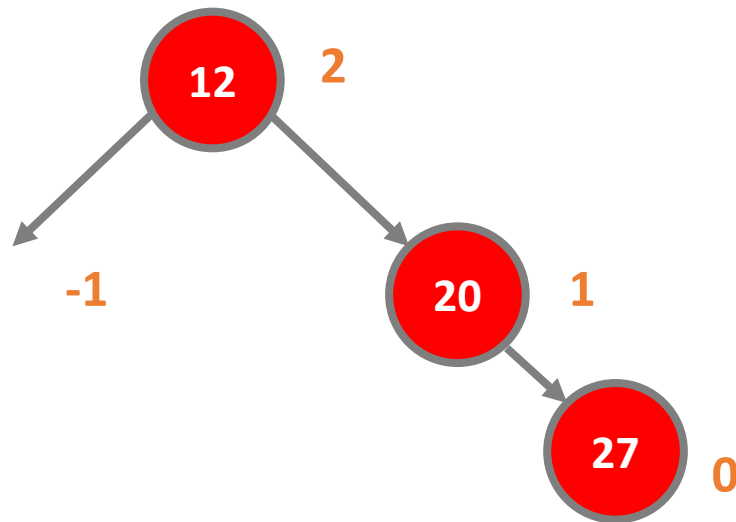


$\text{height} = \max(\text{left child's height}, \text{right child's height}) + 1$

Balance factor:  $h_{\text{left}} - h_{\text{right}}$

The height of a NULL node is -1  
→ leaf nodes have height 0.

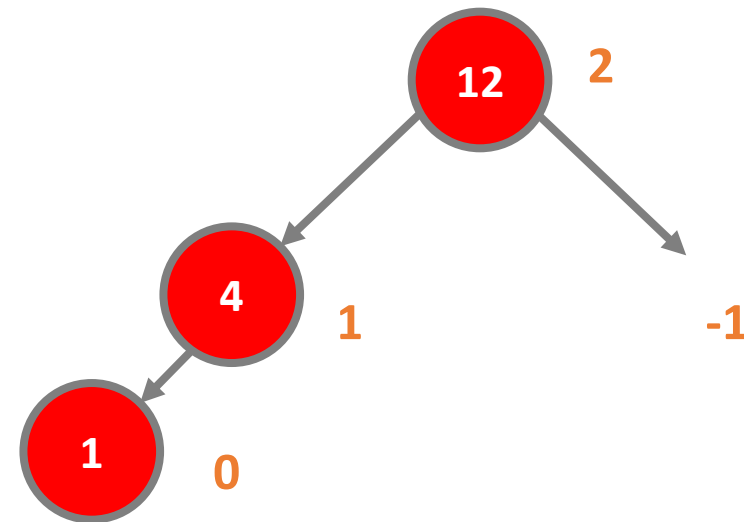
## Module 9 – Trees



Balance factor:  $-1 - 1 = -2$

**Right-heavy** case

→ **Rotate left** to balance

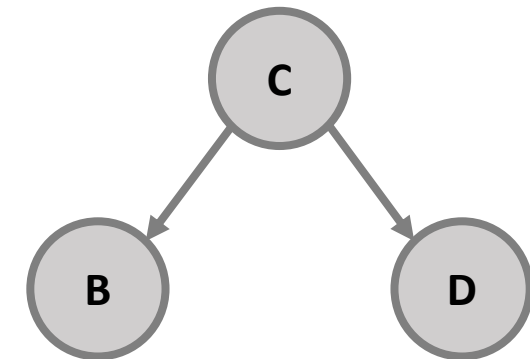
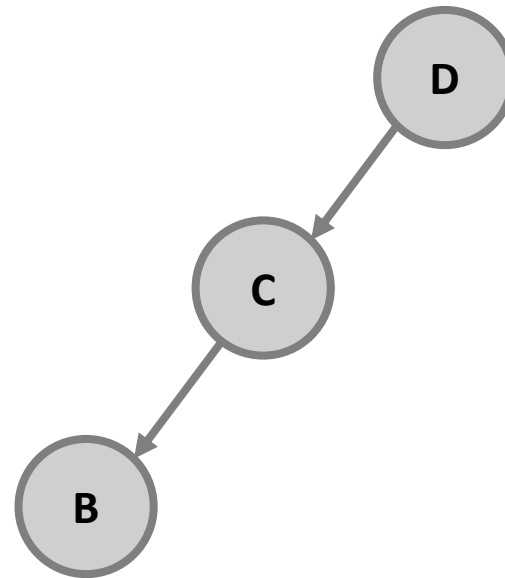
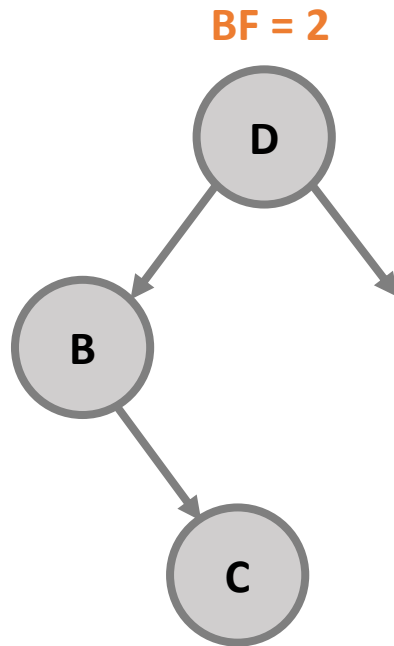


Balance factor:  $1 - (-1) = 2$

**Left-heavy** case

→ **Rotate right** to balance

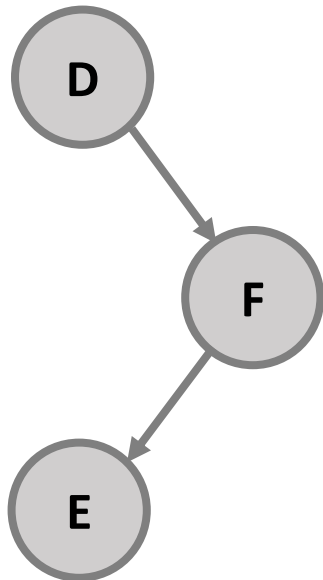
## Module 9 – Trees



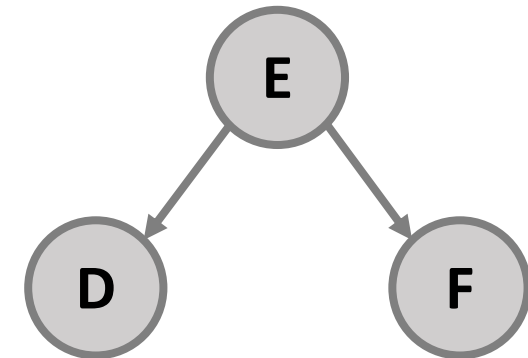
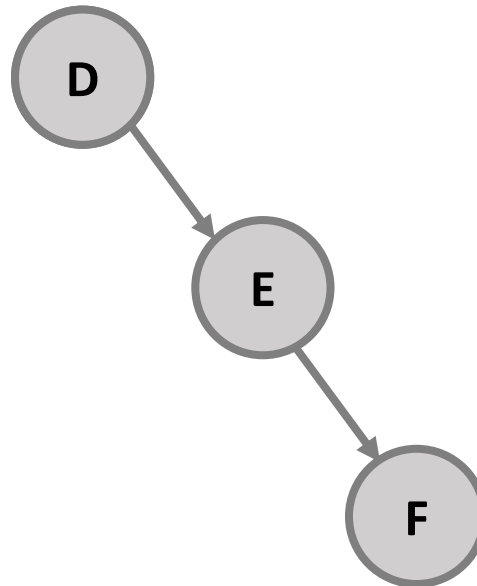
→ left-right heavy  
→ Rotate B left  
→ Rotate D right

## Module 9 – Trees

BF = -2

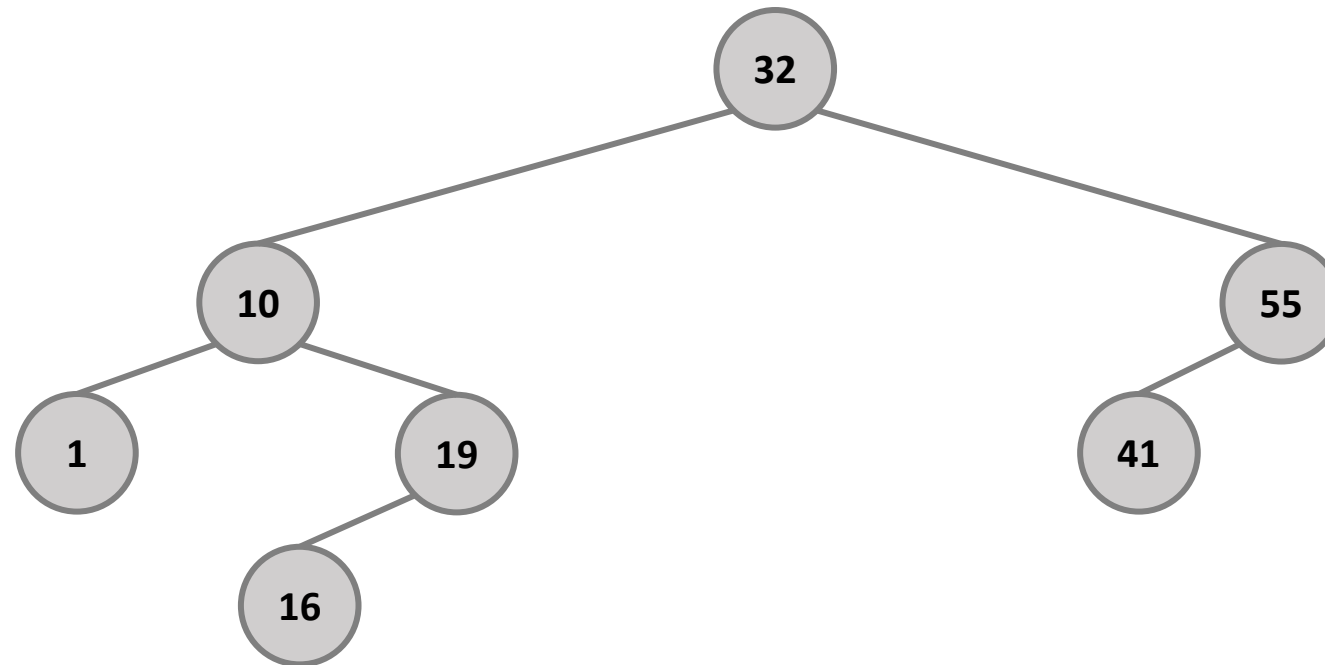


→ right-left heavy  
→ Rotate F right  
→ Rotate D left



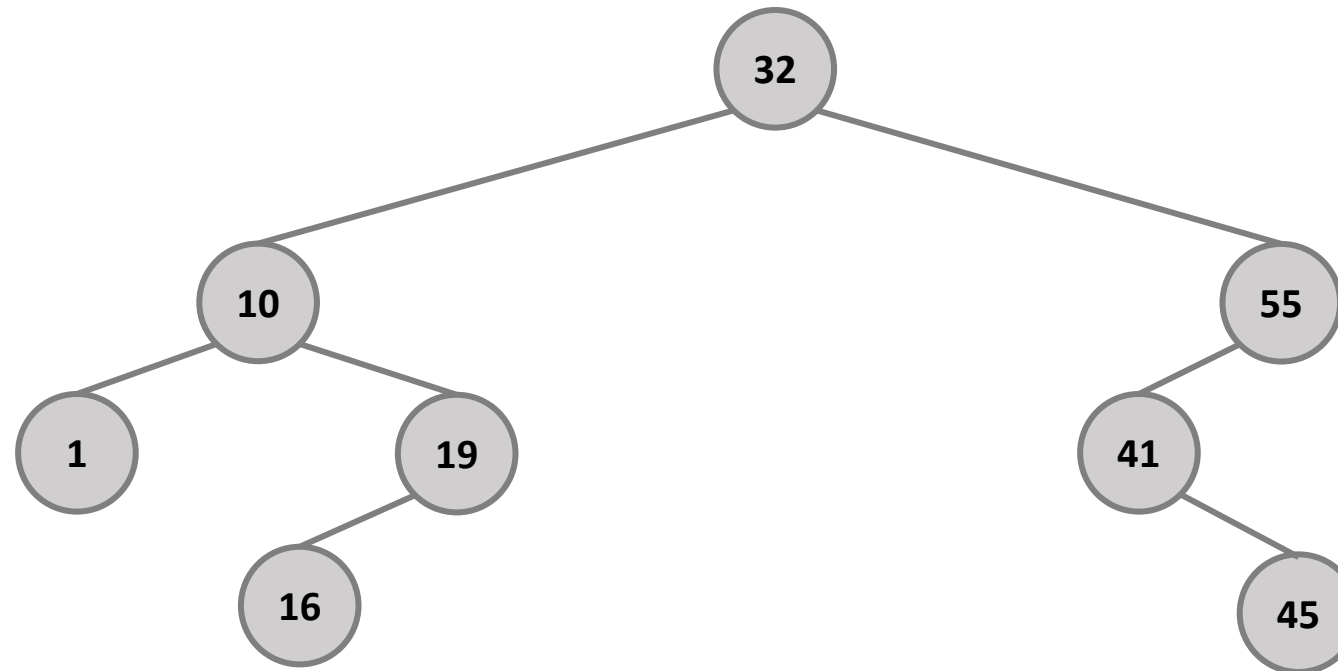
## Module 9 – Trees

- Insertion in AVL trees. E.g., insert 45



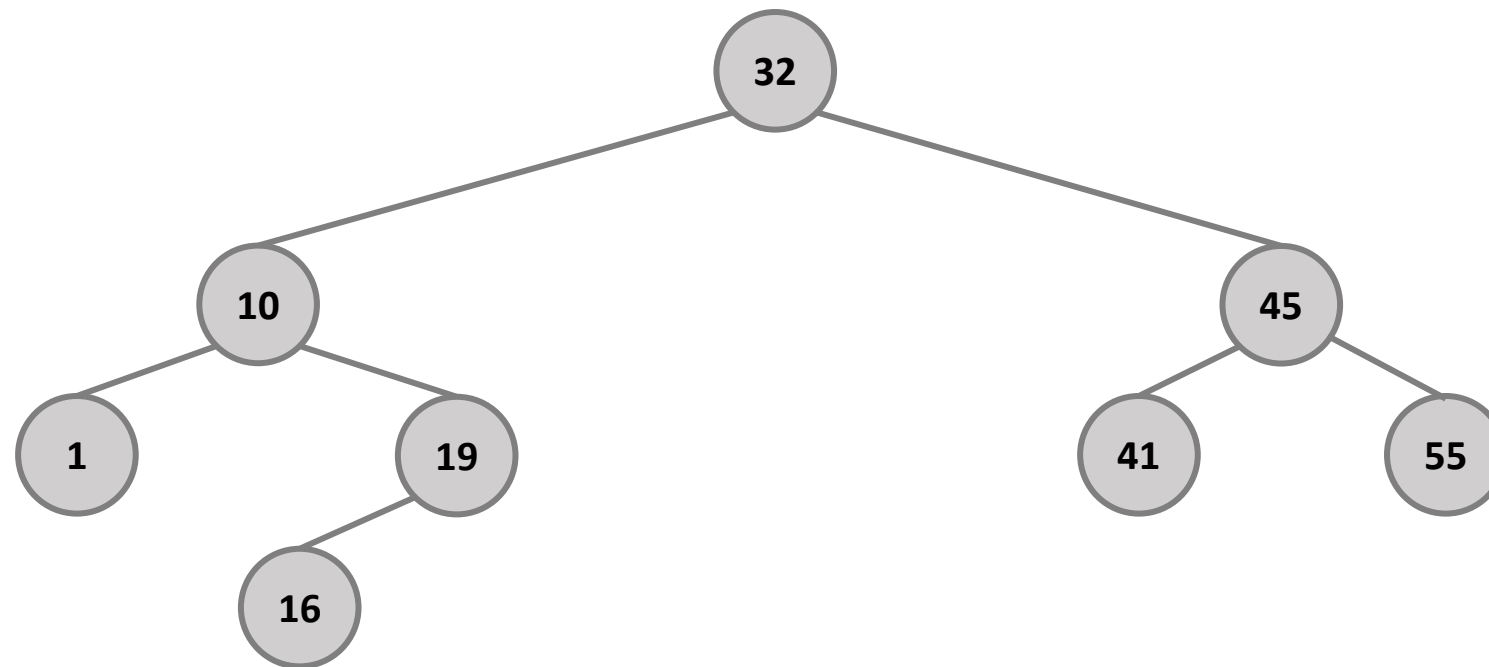
## Module 9 – Trees

- Insertion in AVL trees. E.g., insert 45



## Module 9 – Trees

- Insertion in AVL trees



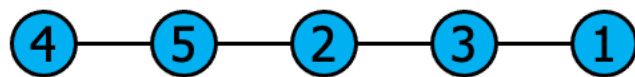


## Module 10 – Priority Queues

- A priority queue stores a collection of items in a (key, value) pair
  - Key → defines the priority
  - Value → the actual data
- Item with the highest priority is dequeued first

## Module 10 – Priority Queues

Unsorted List

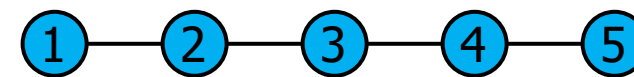


`insert(key, value)`  $\rightarrow O(1)$

`findmin()`  $\rightarrow O(n)$

`removemin()`  $\rightarrow O(n)$

Sorted List



`insert(key, value)`  $\rightarrow O(n)$

`findmin()`  $\rightarrow O(1)$

`removemin()`  $\rightarrow O(n)$

## Module 10 – Priority Queues

Unsorted List

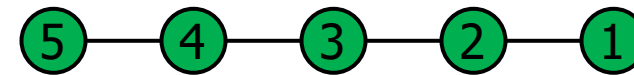


`insert(key, value)`  $\rightarrow O(1)$

`findmin()`  $\rightarrow O(n)$

`removemin()`  $\rightarrow O(n)$

Sorted List



`insert(key, value)`  $\rightarrow O(n)$

`findmin()`  $\rightarrow O(1)$

`removemin()`  $\rightarrow O(1)$

By storing the data in reverse order

## Module 10 – Priority Queues

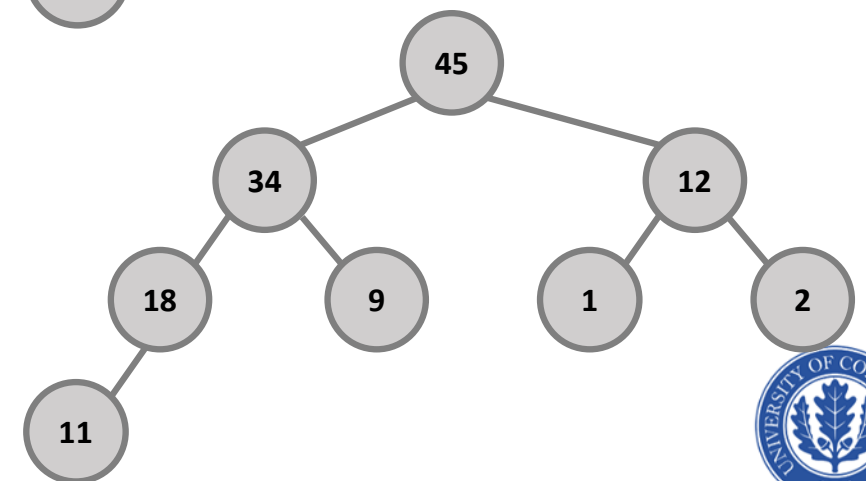
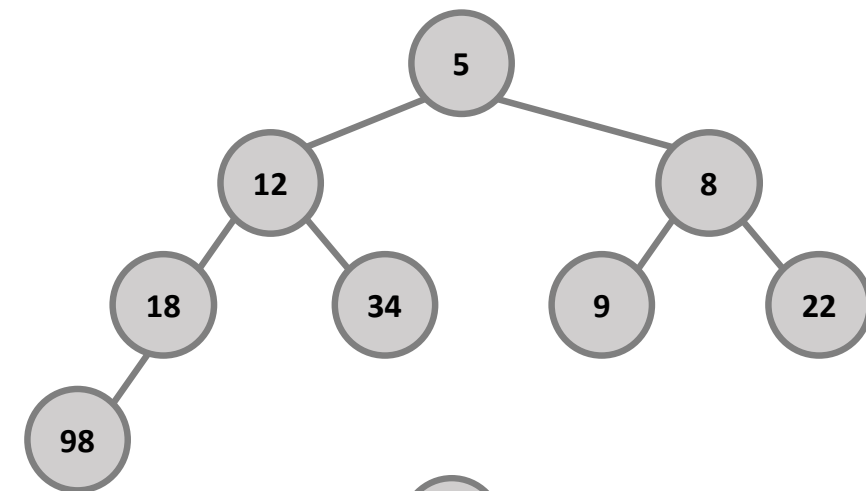
- **Heaps** are data structures that are used to implement priority queues (ADT)
- Most common implementation of heap → binary tree
- Standard term used for *priority* is “key”
  - Unlike **maps** data structure, keys (priority) in **heaps** can be same
- Heaps are **complete** data structure
  - BST → each node has left and right child
  - Construct heap from left to right across each row
  - Last row may not be fully completed

## Module 10 – Priority Queues

Every node can have 2 children, so heaps are almost-complete binary trees.

**min heap:** the parent node is always smaller than the child nodes (left and right nodes)

**max heap:** the parent node is always greater than the child nodes (left and right nodes)



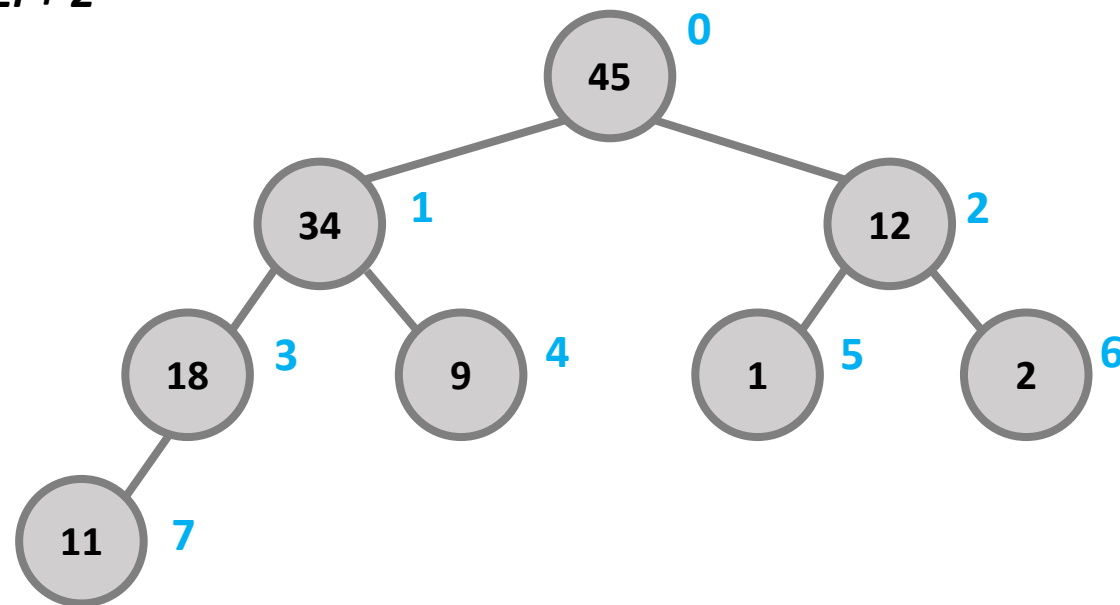
## Module 10 – Priority Queues

Heaps can be represented in 1-D form

- Each element can be given an index value

Any node placed at index  $i$  has:

- **Left** child placed at index  $2i + 1$
- **Right** child placed at index  $2i + 2$



0	
1	
2	
3	
4	
5	
6	
7	

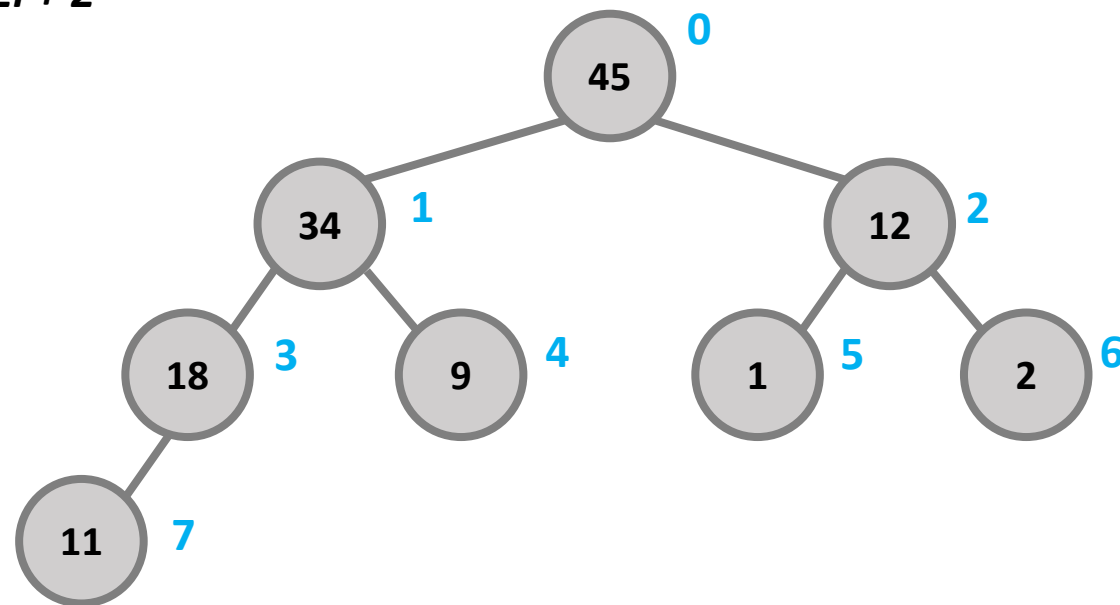
## Module 10 – Priority Queues

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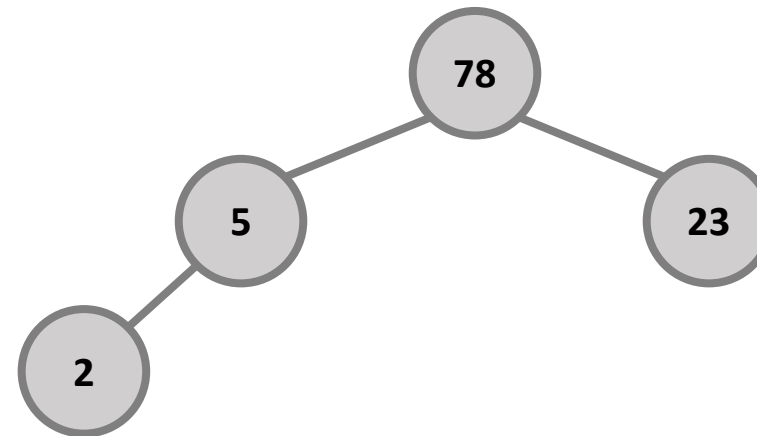
- Left** child placed at index  $2i + 1$
- Right** child placed at index  $2i + 2$



0	45
1	34
2	12
3	18
4	9
5	1
6	2
7	11

## Module 10 – Priority Queues

Insert(92)



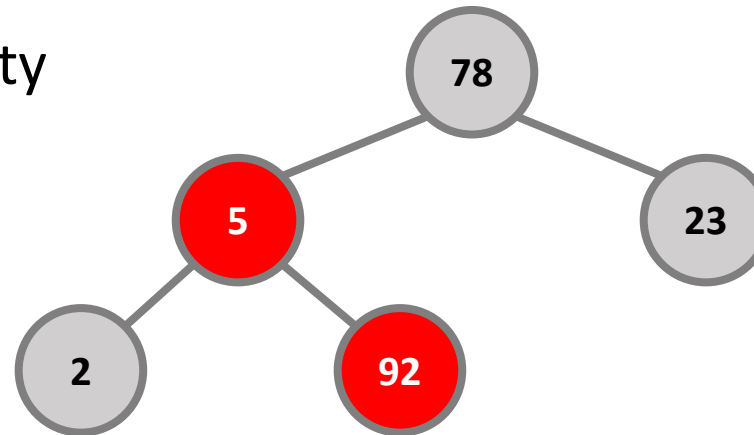
0	78
1	5
2	23
3	2
4	
5	
6	
7	



## Module 10 – Priority Queues

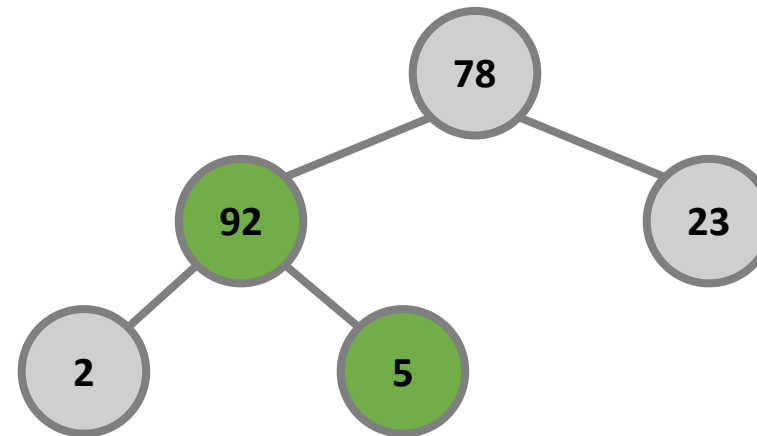
Insert(92)

Violating max heap property



0	78
1	5
2	23
3	2
4	92
5	
6	
7	

## Module 10 – Priority Queues

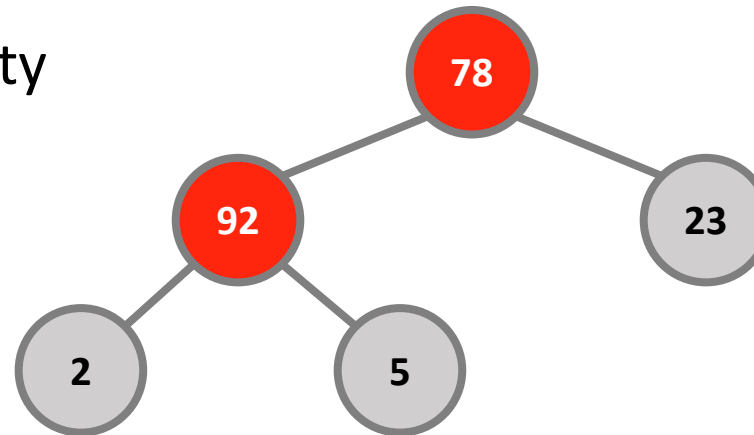


0	78
1	92
2	23
3	2
4	5
5	
6	
7	

## Module 10 – Priority Queues

Insert(92)

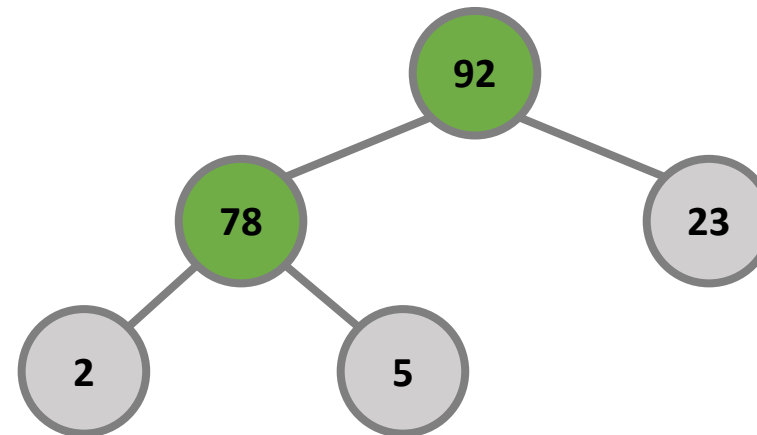
Violating max heap property



0	78
1	92
2	23
3	2
4	5
5	
6	
7	

## Module 10 – Priority Queues

Insert(92)



0	92
1	78
2	23
3	2
4	5
5	
6	
7	

Module 10 – Priority Queues

Show how the following “Min” heap array will be filled up when the `insert` method is executed periodically on the given data. Also indicate where heap violation occurs (X) and where it is finally fixed (✓) as shown in the example below.

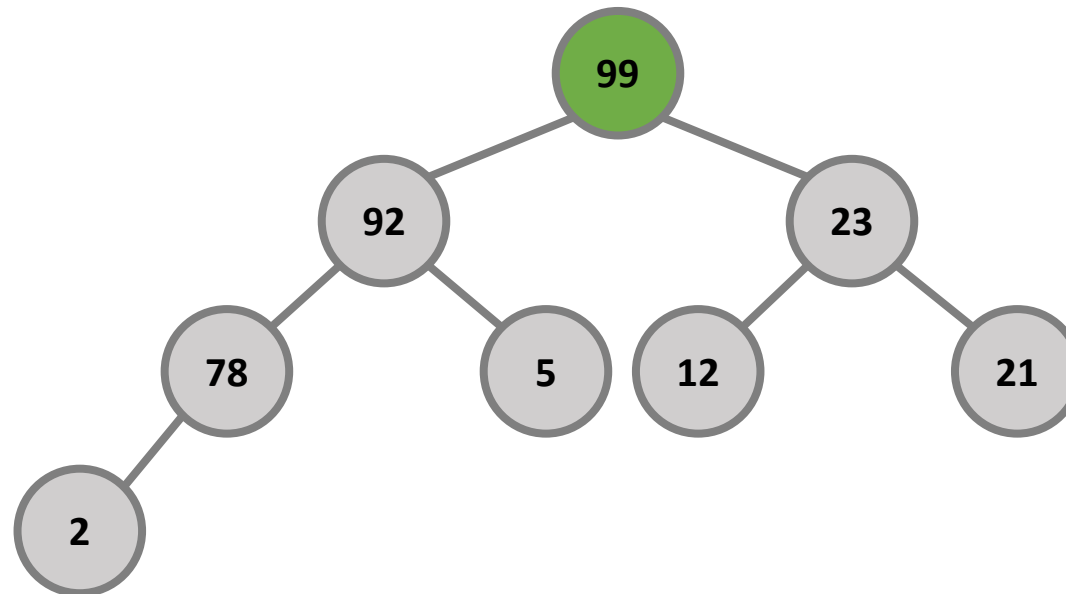
`insert(A, 23)`  
`insert(B, 5)`  
`insert(C, 78)`  
`insert(D, 2)`  
`insert(E, 29)`  
`insert(F, 12)`  
`insert(G, 14)`  
`insert(H, 1)`

		(X)	(✓)		(X)	(✓)		(X)	(✓)		(X)	(✓)		(X)	(✓)
0	A, 23	A, 23	B, 5	B, 5	B, 5	B, 5	D, 2	D, 2	D, 2	D, 2	D, 2	D, 2	D, 2	D, 2	H, 1
1		B, 5	A, 23	A, 23	A, 23	D, 2	B, 5	B, 5	B, 5	B, 5	B, 5	B, 5	B, 5	H, 1	D, 2
2				C, 78	C, 78	C, 78	C, 78	C, 78	C, 78	F, 12	F, 12	F, 12	F, 12	F, 12	F, 12
3					D, 2	A, 23	A, 23	A, 23	A, 23	A, 23	A, 23	A, 23	H, 1	B, 5	B, 5
4								E, 29	E, 29	E, 29	E, 29	E, 29	E, 29	E, 29	E, 29
5									F, 12	C, 78	C, 78	C, 78	C, 78	C, 78	C, 78
6											G, 14	G, 14	G, 14	G, 14	G, 14
7												H, 1	A, 23	A, 23	A, 23



## Module 10 – Priority Queues

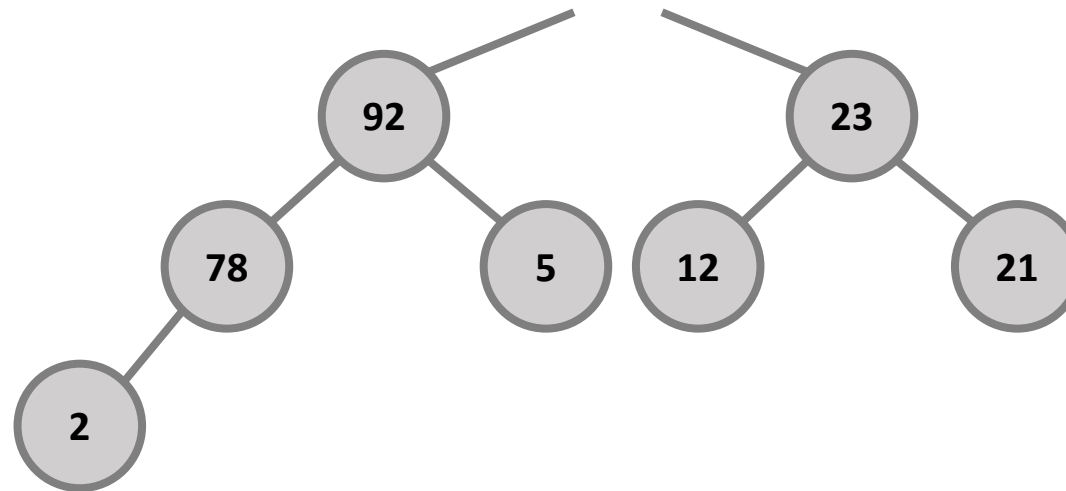
RemoveMax()



0	99
1	92
2	23
3	78
4	5
5	12
6	21
7	2

## Module 10 – Priority Queues

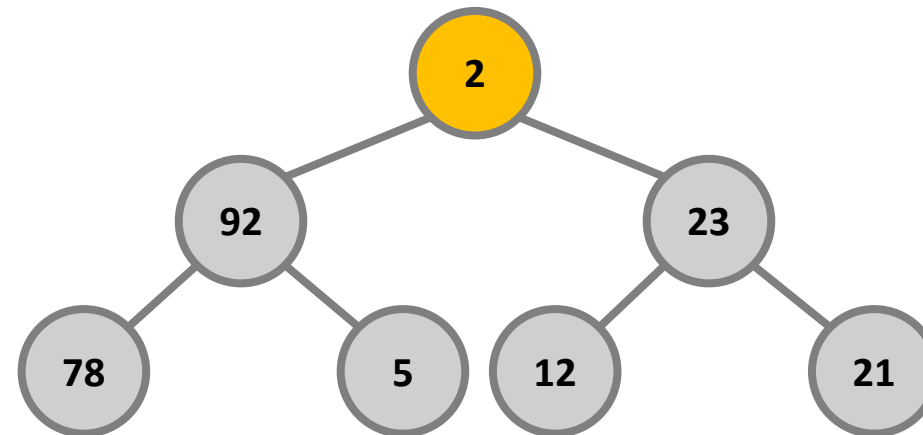
RemoveMax()



0	
1	92
2	23
3	78
4	5
5	12
6	21
7	2

## Module 10 – Priority Queues

RemoveMax()



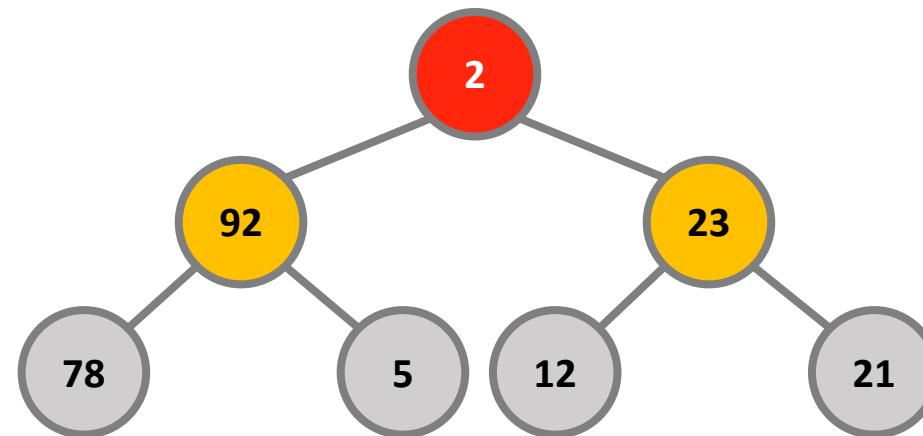
0	2
1	92
2	23
3	78
4	5
5	12
6	21
7	

- Replaced the empty element with the last element



## Module 10 – Priority Queues

RemoveMax()

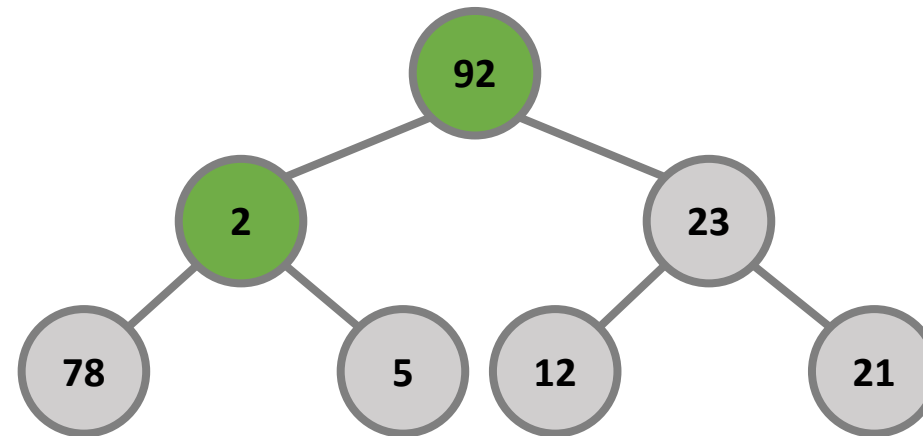


- Now check for property violation starting from the root node to the lead node
- → **Heapify operation**
- Compare both children and swap with the greatest one

0	2
1	92
2	23
3	78
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

RemoveMax()

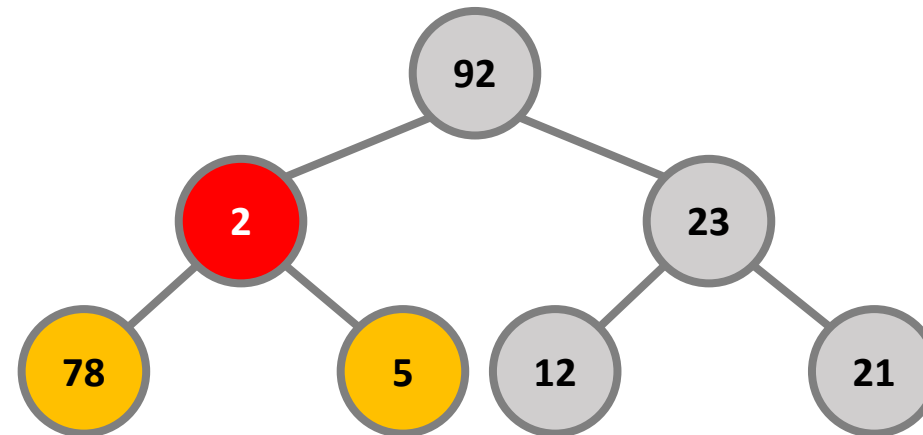


- Now check for property violation starting from the root node to the lead node
- → **Heapify operation**

0	92
1	2
2	23
3	78
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

RemoveMax()

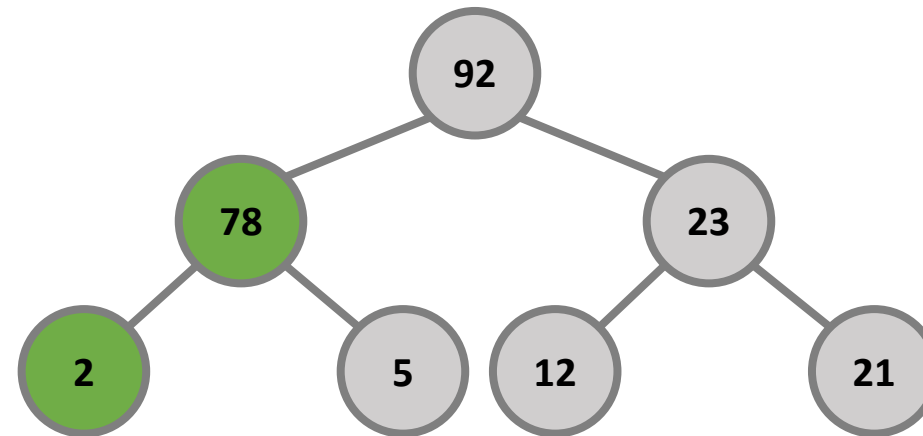


- Now check for property violation starting from the root node to the lead node
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0	92
1	2
2	23
3	78
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

RemoveMax()



- Now check for property violation starting from the root node to the lead node
- → **Heapify operation**
- Compare both children and swap with the greatest one

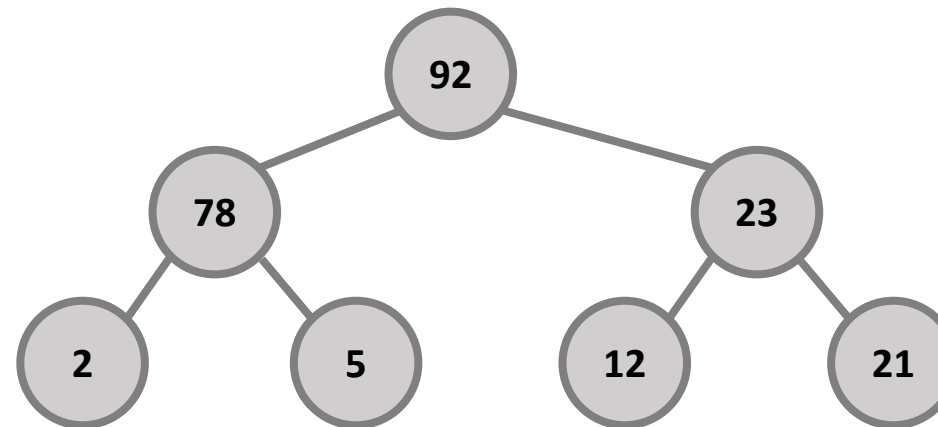
0	92
1	78
2	23
3	2
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

- Removing the root node (and usually this is the case) can be done in  $O(\log n)$  running time
  - Remove an arbitrary item
    - Finding it in the array requires  $O(n)$  and then we can remove it in  $O(\log n)$
- ➔ Removing arbitrary item requires  $O(n)$  time complexity

## Module 10 – Priority Queues

REMOVE(12)

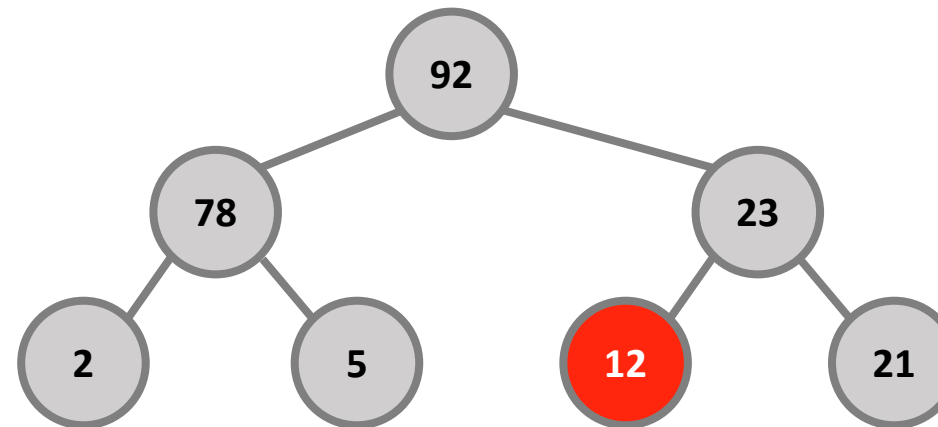


0	92
1	78
2	23
3	2
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

**REMOVE(12)**

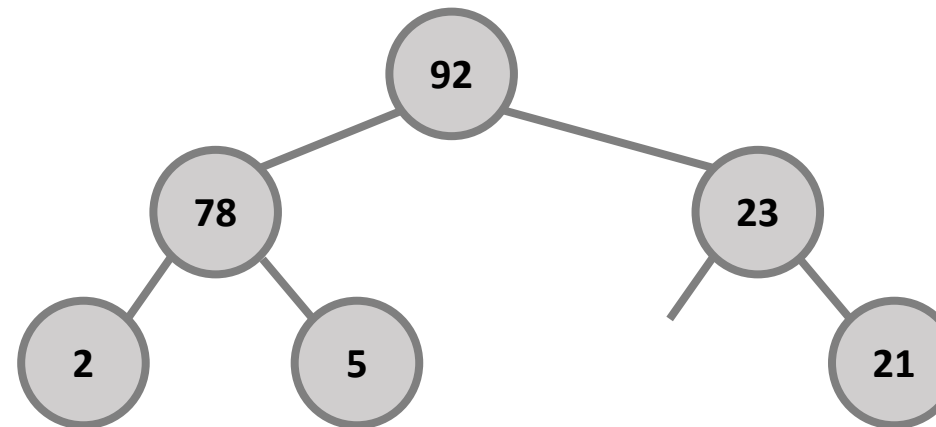
Finding it in the array requires  $O(n)$



0	92
1	78
2	23
3	2
4	5
5	12
6	21
7	

## Module 10 – Priority Queues

REMOVE(12)



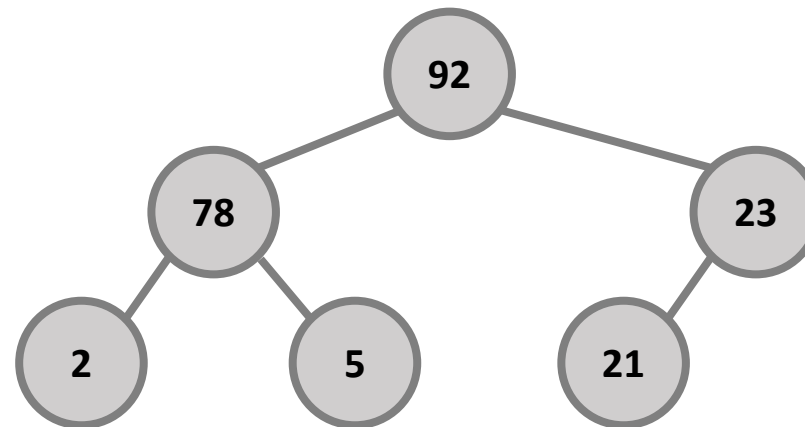
- There can not be a **hole** in the data structure
- Replace it with the last item in the heap

0	92
1	78
2	23
3	2
4	5
5	
6	21
7	



## Module 10 – Priority Queues

REMOVE(12)



- There can not be a **hole** in the data structure
- Replace it with the last item in the heap
- After swapping, check for property violation all the way up till the root node  $\rightarrow O(\log n)$

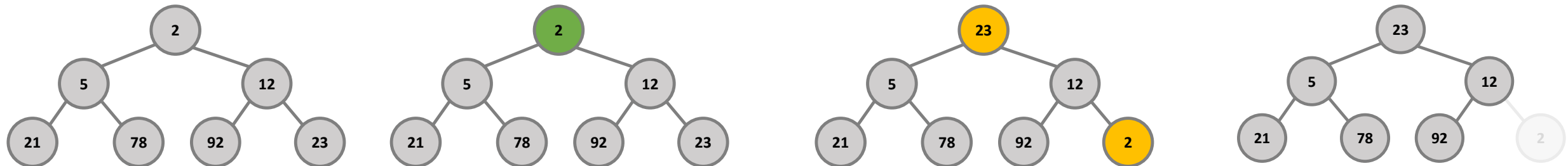
0	92
1	78
2	23
3	2
4	5
5	21
6	
7	

Removing arbitrary item:  $O(n) + O(\log n) = O(n)$

## Module 10 – Priority Queues

**Heapsort**

1. Read the root node
2. Swap the root node with the last item
3. Heapify to abide by Heap properties
4. Repeat steps 1 and 2 for all nodes (except the last items which have already been read)

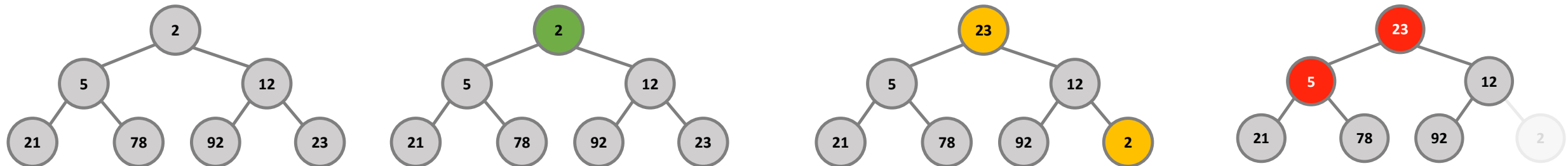


[2]

## Module 10 – Priority Queues

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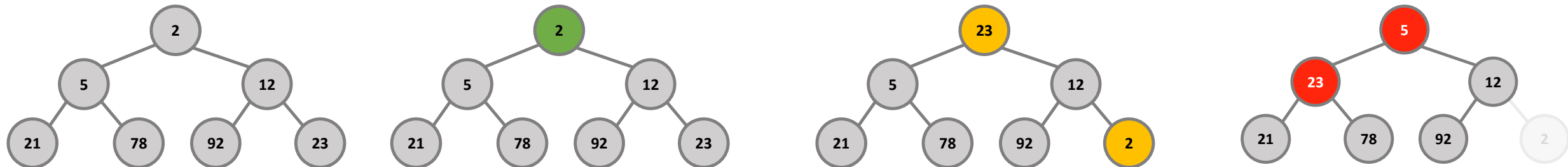


[2]

## Module 10 – Priority Queues

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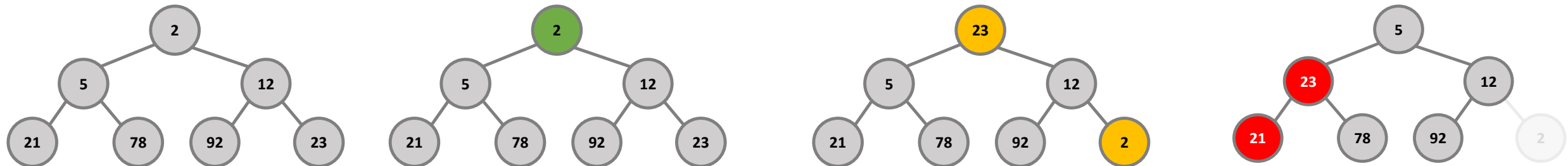


[2]

## Module 10 – Priority Queues

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3. Heapify to abide by Heap properties
4. Repeat steps 1 and 2 for all nodes (except the last items which have already been read)

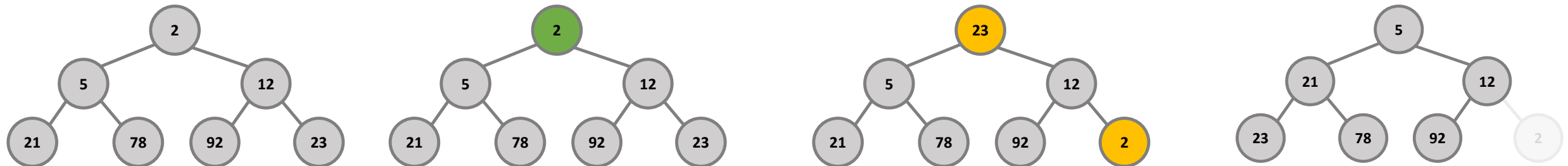


[2]

## Module 10 – Priority Queues

**Heapsort**

1. Read the root node
2. Swap the root node with the last item
3. Heapify to abide by Heap properties
4. Repeat steps 1 and 2 for all nodes (except the last items which have already been read)

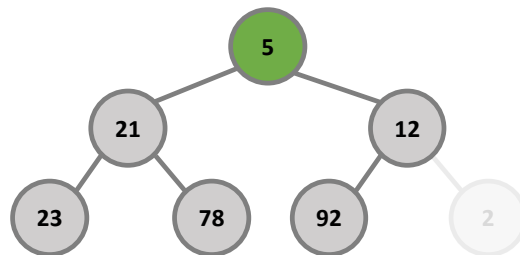
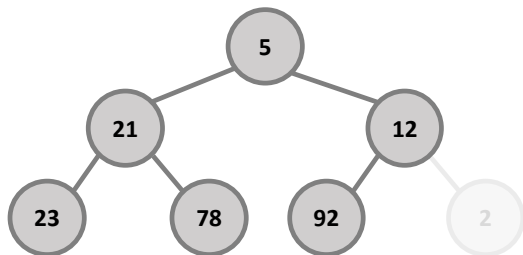


[2]

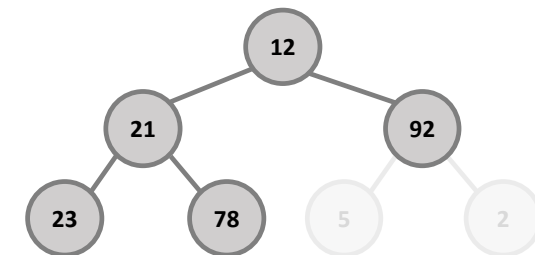
## Module 10 – Priority Queues

**Heapsort**

1. Read the root node
2. Swap the root node with the last item
3. Heapify to abide by Heap properties
4. Repeat steps 1 and 2 for all nodes (except the last items which have already been read)



...

 $[2, 5]$

Module 10 – Priority Queues

Go through this activity

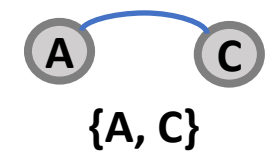
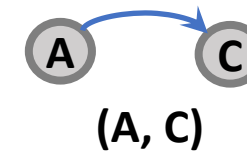
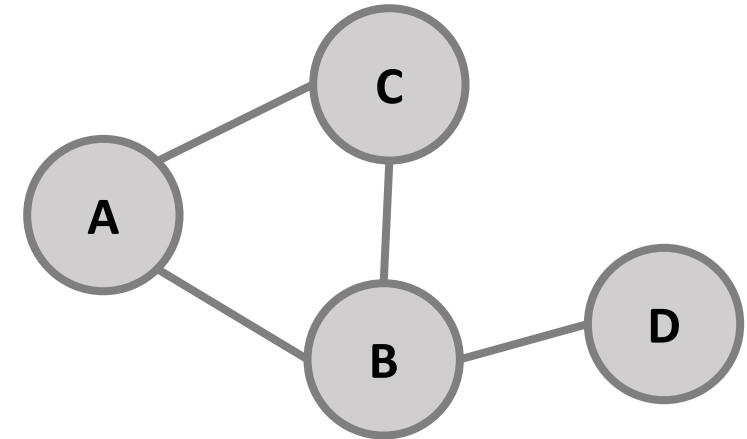
	Read	Swap	After final Heapify
1.	<div><pre>graph TD; 92((92)) --- 78((78)); 92 --- 23((23)); 78 --- 2((2)); 78 --- 5((5)); 23 --- 12((12)); 23 --- 21((21));</pre><p>[92]</p></div>	<div><pre>graph TD; 21((21)) --- 78((78)); 21 --- 23((23)); 78 --- 2((2)); 78 --- 5((5)); 23 --- 12((12)); 23 --- 92((92));</pre></div>	<div><pre>graph TD; 78((78)) --- 21((21)); 78 --- 23((23)); 21 --- 2((2)); 21 --- 5((5)); 23 --- 12((12)); 23 --- X((X));</pre></div>



## Module 11 – Graphs

### Graphs

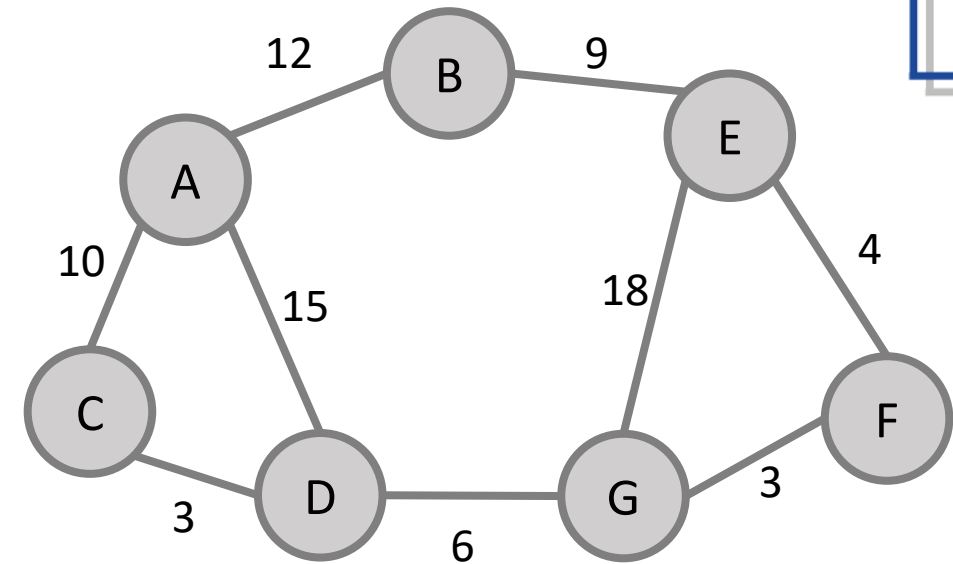
- Edges can connect any vertex
- Any vertex can be accessed through any path
- Edges can be directed or undirected
- $G = (V, E)$ 
  - $V = \{A, B, C, D\}$
  - $E = \{ \{A, C\}, \{A, B\}, \{B, C\}, \{B, D\} \}$



## Module 11 – Graphs

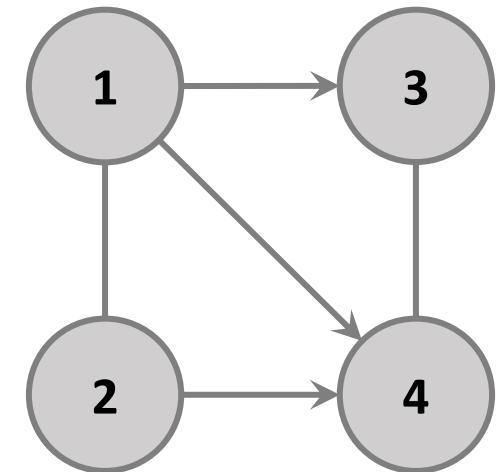
### Graphs Terms and Types

- Cycle, Path,
- Directed, undirected, mixed, complete, weighted, in/out-degree
- Representation
  - Edge Set Representation
- Adjacency Set Representation



$V = \{1, 2, 3, 4\}$   
 $E = \{ (1, 2), (1, 3), (1, 4),$   
 $(2, 1), (2, 4),$   
 $(3, 4), (4, 3) \}$

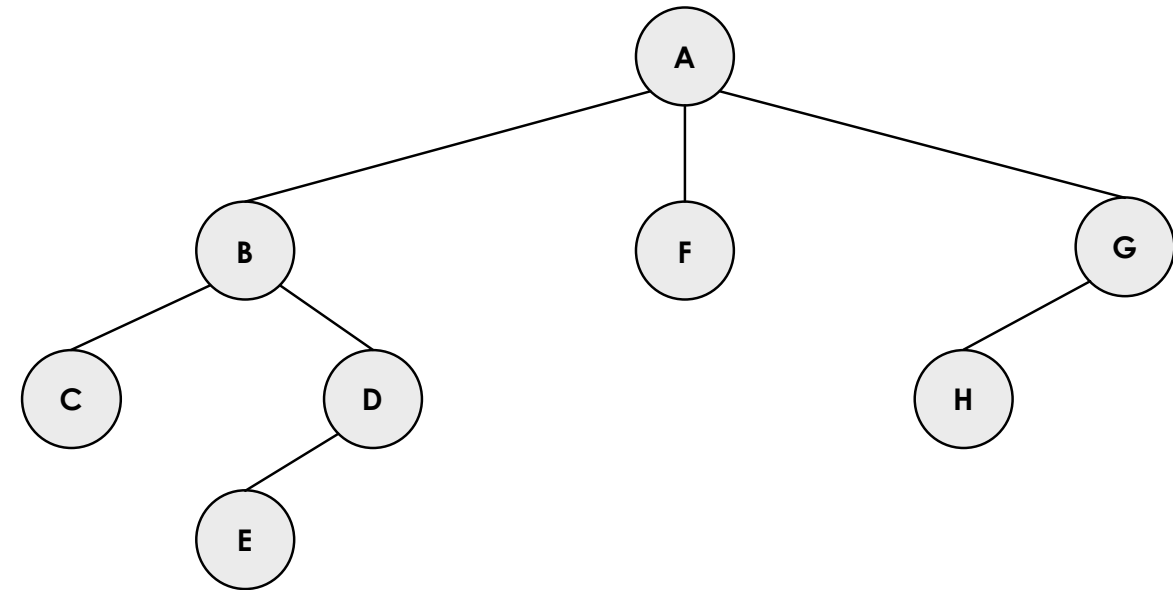
$V = \{1, 2, 3, 4\}$   
 $nbrs = \{ 1: \{2, 3, 4\},$   
 $2: \{1, 4\},$   
 $3: \{4\},$   
 $4: \{3\}, \}$



## Module 11 – Graphs

Purpose of graph traversal is to visit all the nodes/vertices of a graph

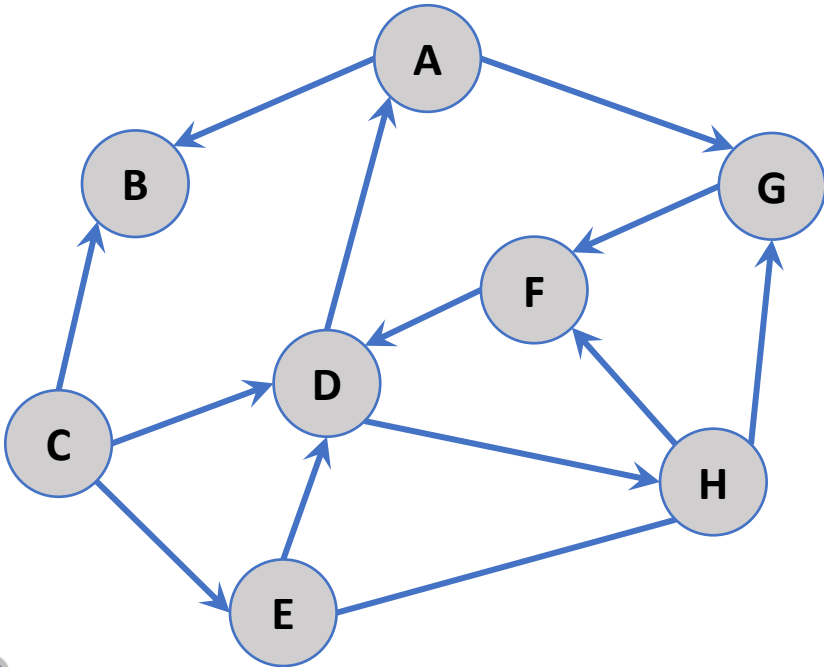
- Breadth-First Search (BFS)
  - ➔ Visit order → A, B, F, G, C, D, H, E
  - ➔ Based on queue implementation
- Depth-First Search (DFS)
  - ➔ Visit order → A, B, C, D, E, F, G, H
  - ➔ Based on stack implementation



## Module 11 – Graphs

Using BFS, Starting from vertex C, visit all the vertices in alphabetical order and fill the following table.

First element is the front of Q.  
After dequeuing a vertex, enqueue (if not already in V) all its neighbors in Q in alphabetical order. Add them in V.

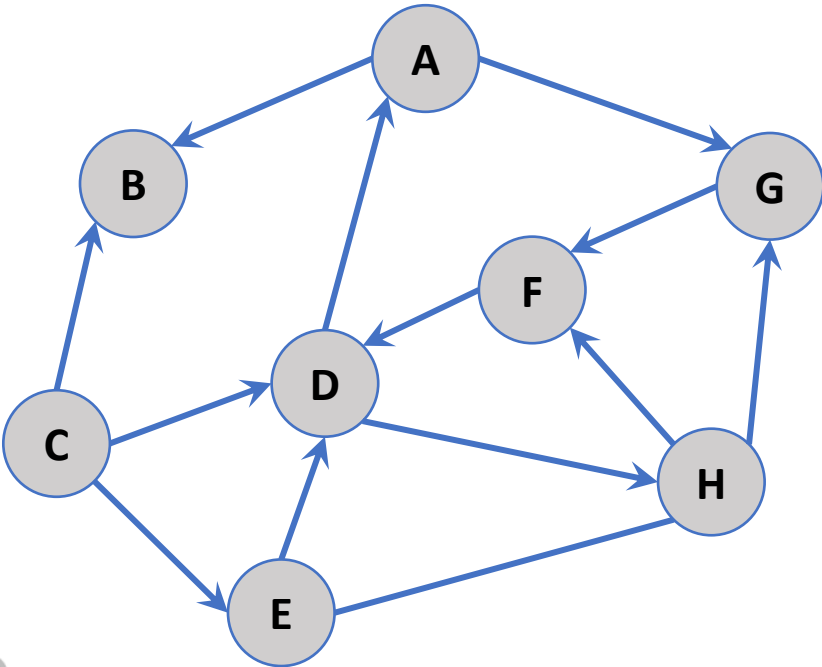


	Q	V
0	[C]	[C]
1	[B, D, E]	[C, B, D, E]
2		
3		
4		
5		
6		
7		
8		
9		
10		

Module 11 – Graphs

Using BFS, Starting from vertex C, visit all the vertices in alphabetical order and fill the following table.

First element is the front of Q.  
After dequeuing a vertex, enqueue (if not already in V) all its neighbors in Q in alphabetical order. Add them in V.



	Q	V
0	[C]	[C]
1	[B, D, E]	[C, B, D, E]
2	[D, E]	[C, B, D, E]
3	[E, A, H]	[C, B, D, E, A, H]
4	[A, H]	[C, B, D, E, A, H]
5	[H, G]	[C, B, D, E, A, H, G]
6	[G, F]	[C, B, D, E, A, H, G, F]
7	[F]	[C, B, D, E, A, H, G, F]
8	[]	[C, B, D, E, A, H, G, F]
9		
10		

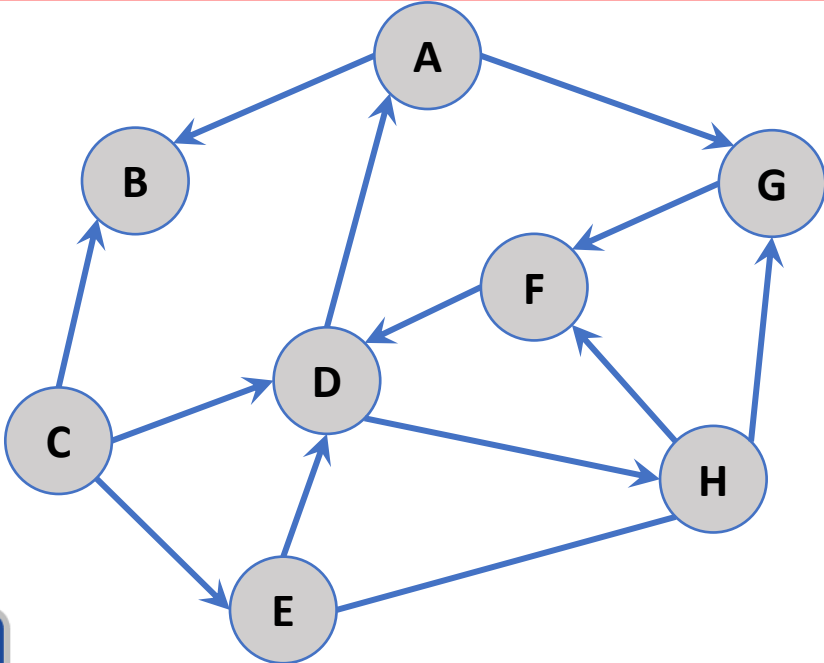


Module 11 – Graphs

Using DFS, Starting from vertex C, visit all the vertices in alphabetical order and fill the following table.

First element is Top of the stack

After popping a vertex out, push its neighbors (if not already in V) in S in alphabetical order. Also, add popped element in V.



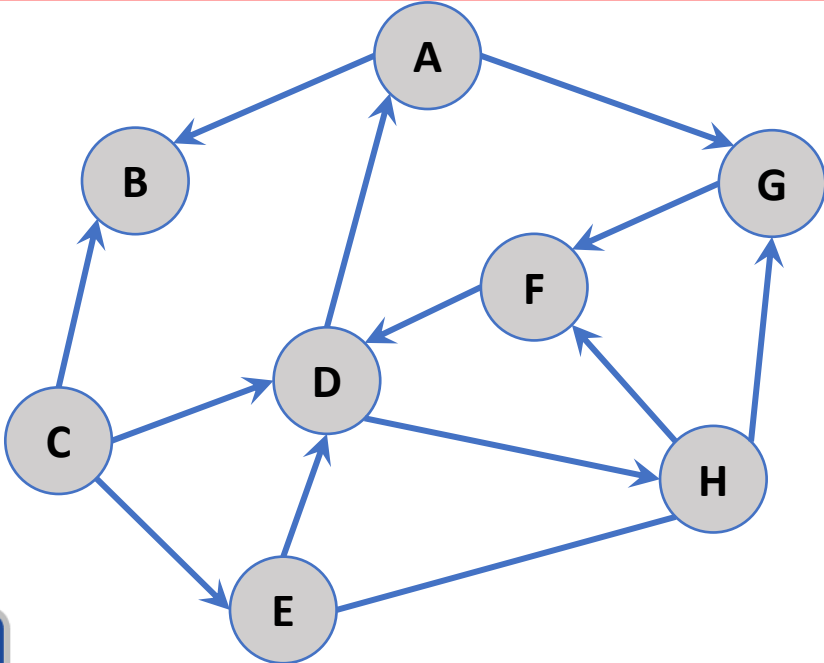
	S	V
0	[C]	[ ]
1	[B, D, E]	[C]
2		
3		
4		
5		
6		
7		
8		
9		
10		

Module 11 – Graphs

Using DFS, Starting from vertex C, visit all the vertices in alphabetical order and fill the following table.

First element is Top of the stack

After popping a vertex out, push its neighbors (if not already in V) in S in alphabetical order. Also, add popped element in V.



	S	V
0	[C]	[ ]
1	[B, D, E]	[C]
2	[D, E]	[C, B]
3	[A, H, E]	[C, B, D]
4	[G, H, E]	[C, B, D, A]
5	[F, H, E]	[C, B, D, A, G]
6	[H, E]	[C, B, D, A, G, F]
7	[E]	[C, B, D, A, G, F, H]
8	[ ]	[C, B, D, A, G, F, H, E]
9		
10		



## Module 11 – Graphs

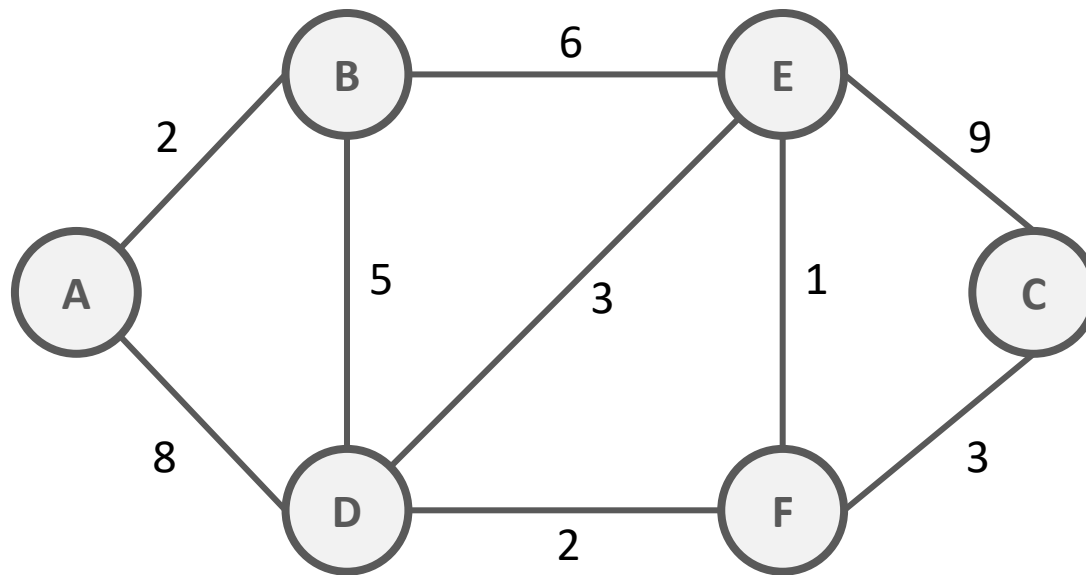
### Dijkstra's Algorithm

- Is used to find the shortest path in a  $G(V, E)$  graph from vertex  $u$  to  $v$ , alongside constructing a shortest path tree as well
- It can handle positive edge weights
- During every iteration, it searches for the minimum distance to the next vertex
- The appropriate data structure is a Heap (Priority Queue)



## Module 11 – Graphs

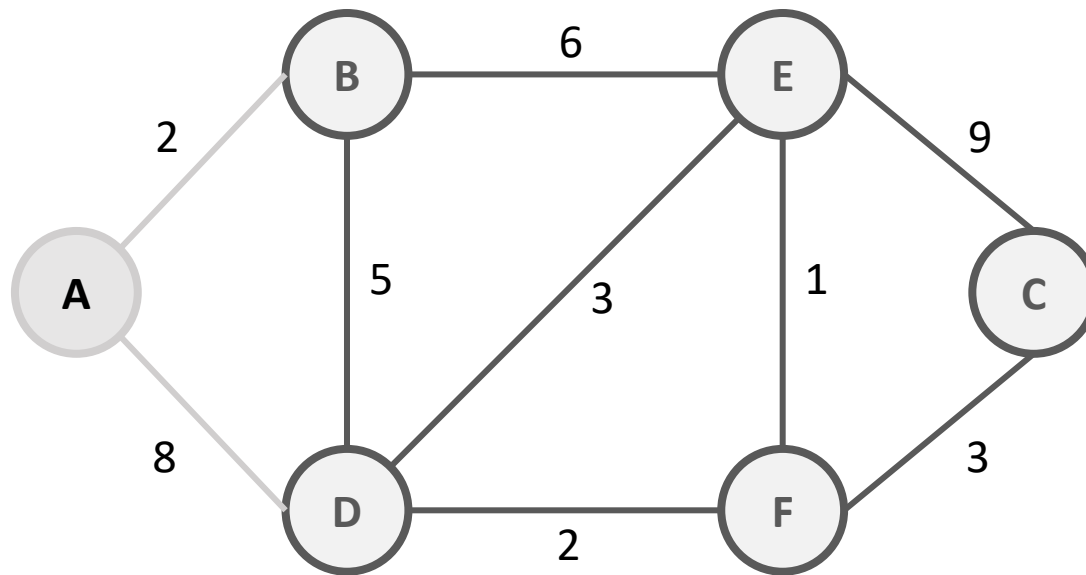
## Dijkstra's Algorithm

 $PQ = [A:0, B:\infty, C:\infty, D:\infty, E:\infty, F:\infty]$  $V = []$ 

Vertex	Shortest Distance	Predecessor Vertex
A	0	
B	$\infty$	
C	$\infty$	
D	$\infty$	
E	$\infty$	
F	$\infty$	

## Module 11 – Graphs

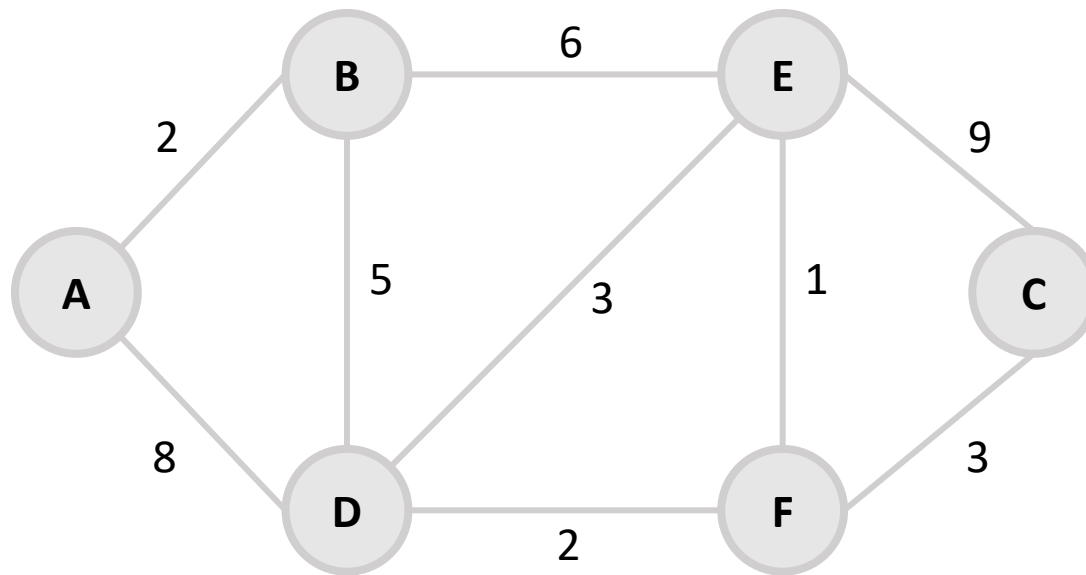
## Dijkstra's Algorithm

 $PQ = [B: 2, C: \infty, D: 8, E: \infty, F: \infty]$  $V = [A]$ 

Vertex	Shortest Distance	Predecessor Vertex
A	0	
B	2	A
C	$\infty$	
D	8	A
E	$\infty$	
F	$\infty$	

## Module 11 – Graphs

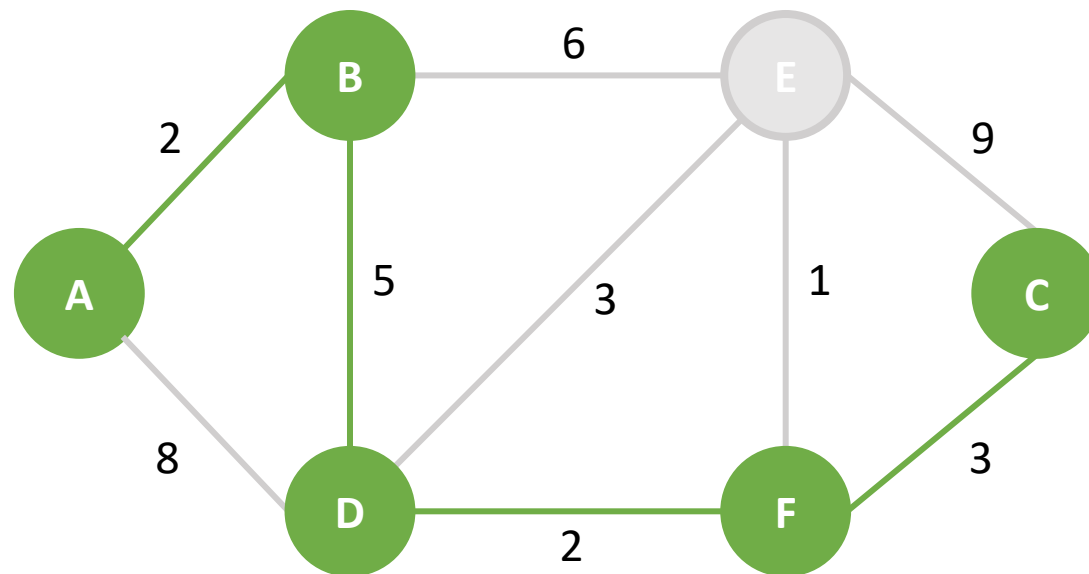
## Dijkstra's Algorithm

 $PQ = []$  $V = [A, B, D, E, F, C]$ 

Vertex	Shortest Distance	Predecessor Vertex
A	0	
B	2	A
C	12	F
D	7	B
E	8	B
F	9	D

## Module 11 – Graphs

## Dijkstra's Algorithm



Shortest path from A to C:  
A-B-D-F-C = 12

PQ = []

V = [A, B, D, E, F, C]

Vertex	Shortest Distance	Predecessor Vertex
A	0	
B	2	A
C	12	F
D	7	B
E	8	B
F	9	D

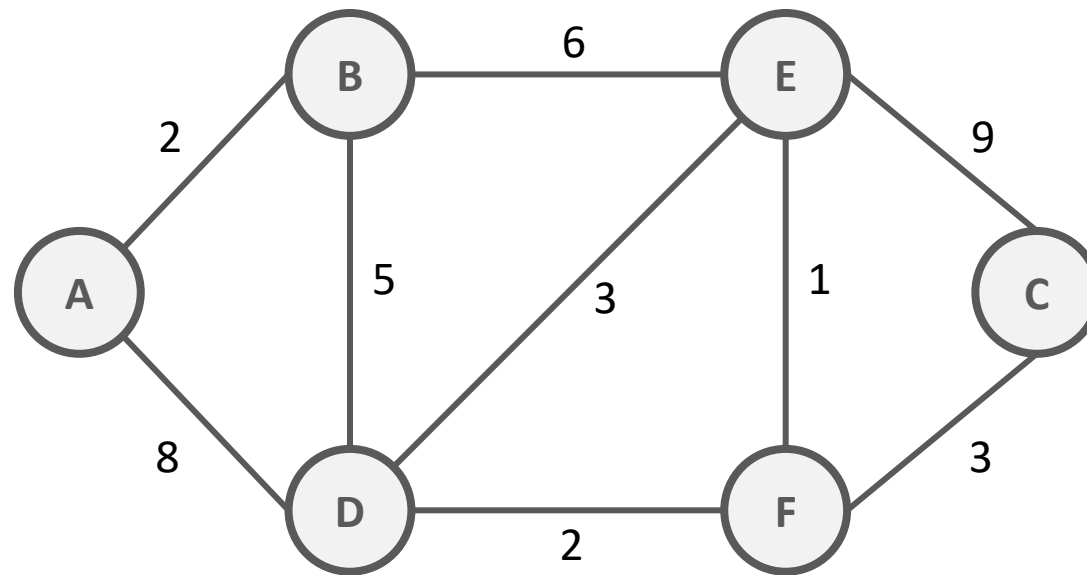
## Module 11 – Graphs

### Minimum Spanning Tree

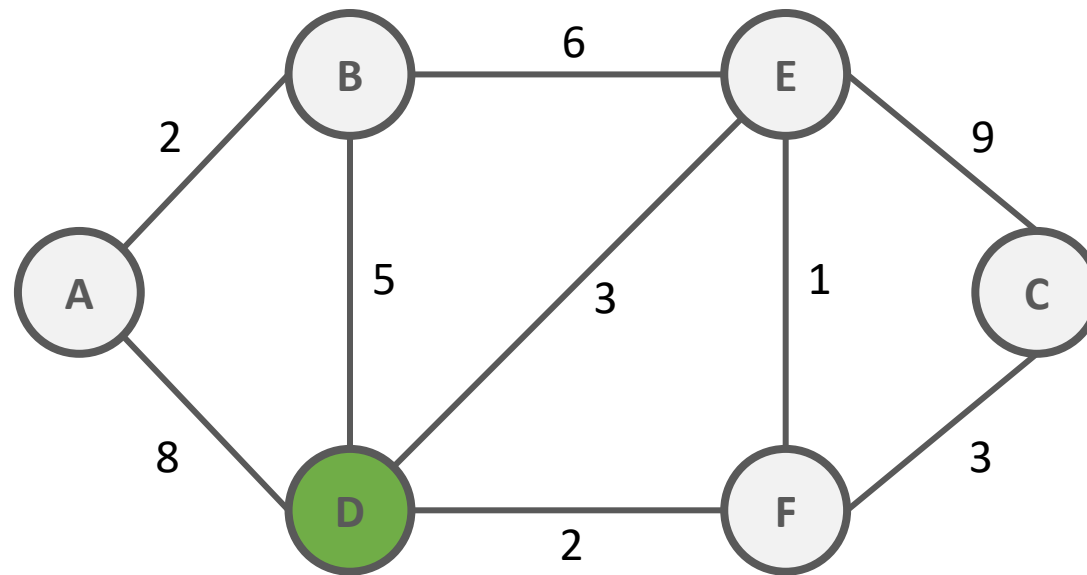
- Given an undirected graph  $G$  with weighted edges, a minimum spanning tree (MST) is a subset of the edges in the graph which:
  - connects all vertices together
  - have no cycles
  - Include edges with minimum weight only
  - Maintain a Priority Queue (PQ) of edges

## Module 11 – Graphs

## Minimum Spanning Tree



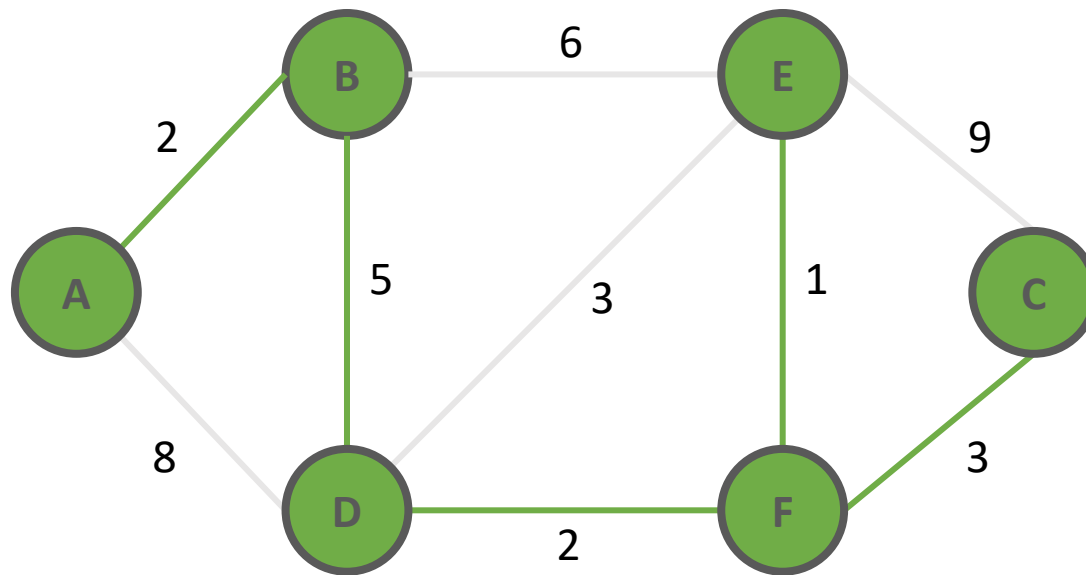
## Module 11 – Graphs



Visited
D

PQ

## Module 11 – Graphs



MST weight =  $2 + 5 + 2 + 1 + 3 = 13$

## Visited

D

F

E

C

B

A

## PQ

D-A, 8

E-B, 6

E-C, 9

MST Edges = 5