

# Data Structures and Algorithms

## Priority Queue Lecture 8: and Heapsort

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# Outline

- Trees and Binary Heaps
- Priority Queue
  - insert
  - deleteMin
- Heapsort

# Motivating Example

3 jobs have been submitted to a printer in the order A, B, C.

Job A	100 pages
Job B	10 pages
Job C	1 page

Average waiting time with **FIFO**:

$$(100 + 110 + 111) / 3 = 107 \text{ time units}$$

Average waiting time with **shortest-job-first**:

$$(1 + 11 + 111) / 3 = 41 \text{ time units}$$



Queue



What Data  
Structure?

A queue capable of insert and deleteMin:

# PRIORITY QUEUE

# Priority Queue

- Priority queue is a data structure which allows at least two operations
  - insert
  - deleteMin
    - finds, returns and removes the minimum elements in the priority queue



- Applications: external sorting, greedy algorithms

# Implementation

- Linked List or Array?

- insert:  $O(1)$

- deleteMin:  $O(n)$



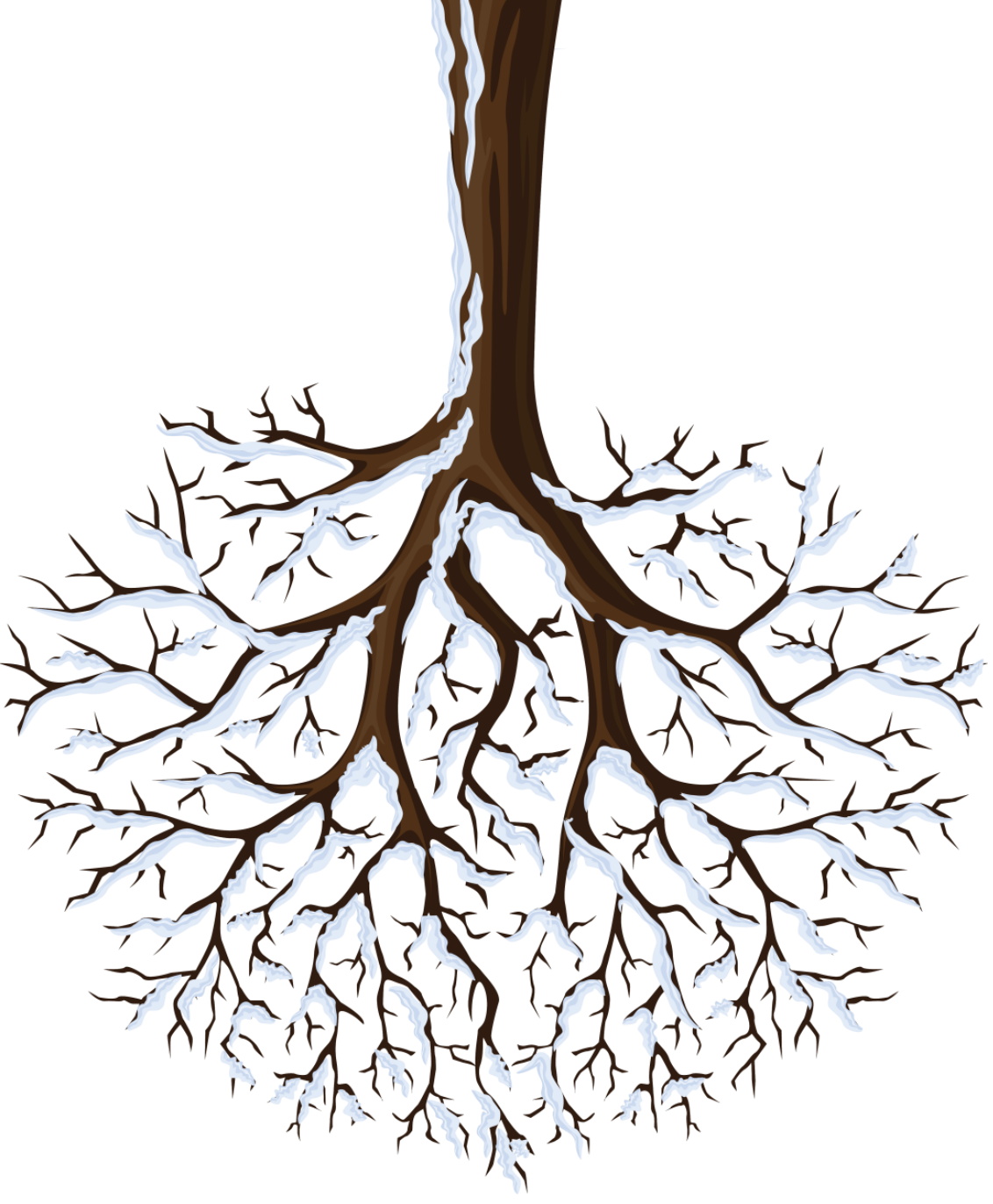
Too Slow

- Goal

- insert:  $O(\log(n))$

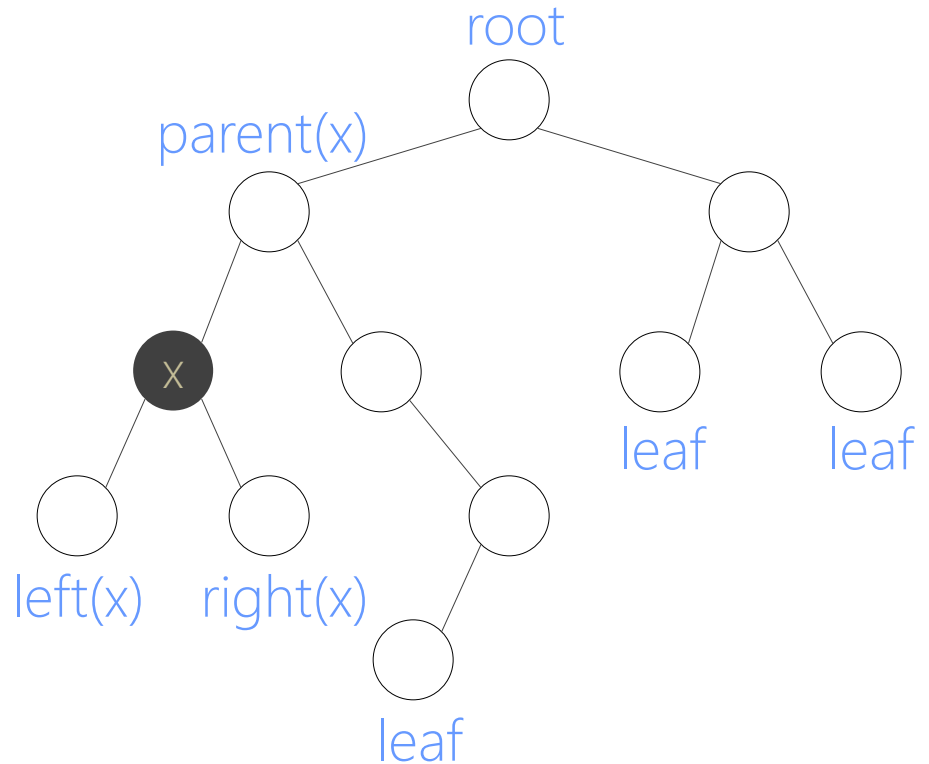
- deleteMin:  $O(\log(n))$

# Implementation: Trees



# Background: Binary Trees

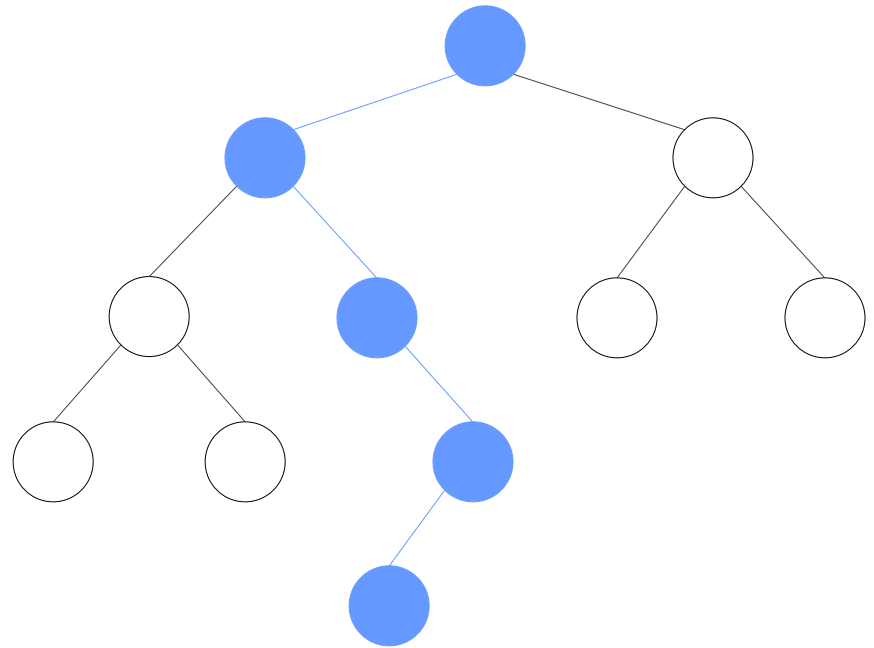
- Has a **root** at the topmost level
- Each **node** has **zero, one or two children**
- A node that has no child is called a **leaf**
- For a node  $x$ , we denote the **left child**, **right child** and the **parent** of  $x$  as  $\text{left}(x)$ ,  $\text{right}(x)$  and  $\text{parent}(x)$ , respectively.





# Tree Height (Depth)

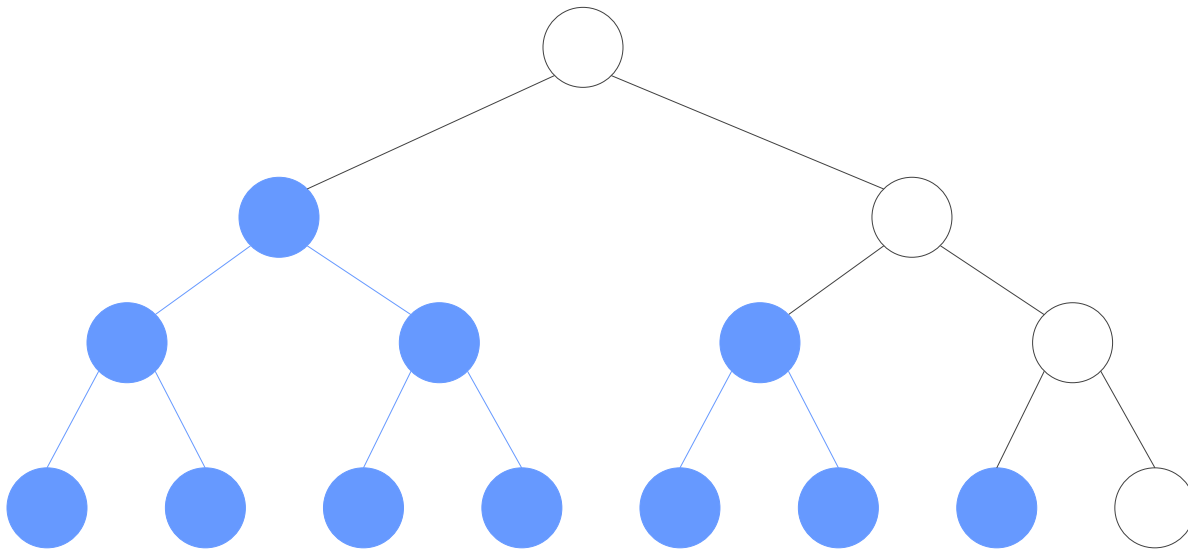
- The number of edges on the longest path from the root to a leaf



height = depth = 4

# Perfect Binary Trees

- A perfect binary tree is the tree
  - where a node can have 0 or 2 children and
  - all leaves are at the same depth

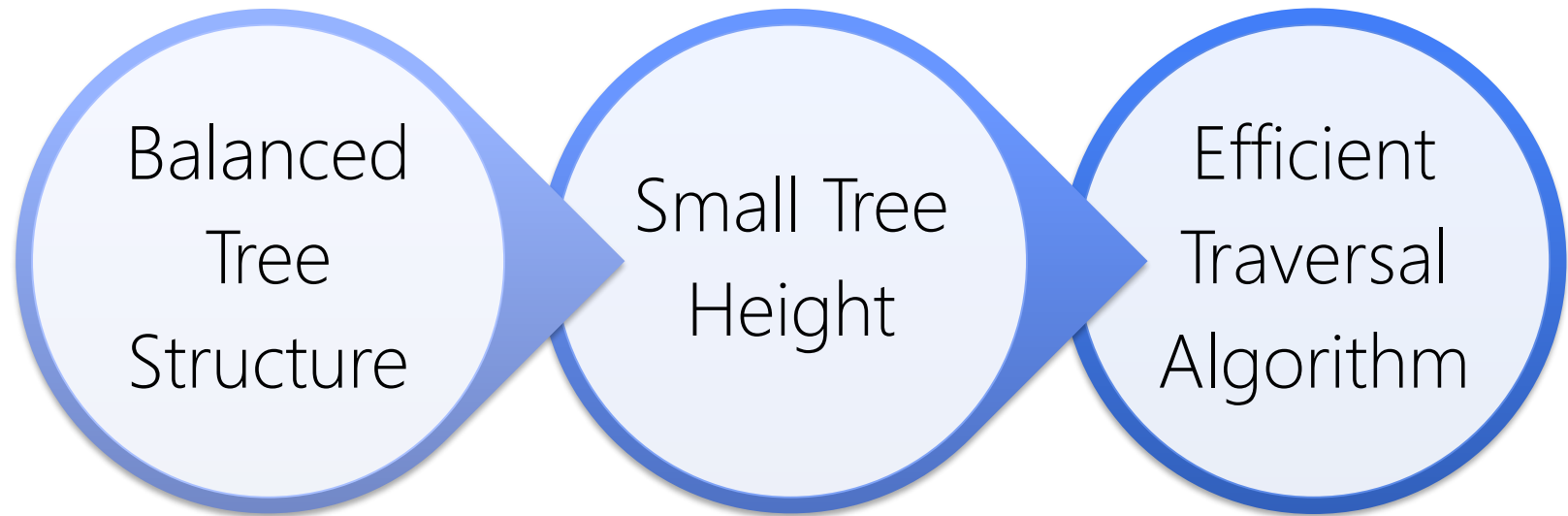


height	# of nodes
0	1
1	3
2	7
3	15
d	$2^{d+1} - 1$

# Property

- A perfect binary tree with  $n$  nodes has height of  $O(\log(n))$ 
  - Implication: If the number of node access within an algorithm is bounded by the *tree height*, then its complexity is  $O(\log(n))$ !
- Side notes
  - The largest depth of a binary tree of  $n$  nodes is  $O(n)$
  - What is the shape of the tree?

**Given the number of nodes (data size):**



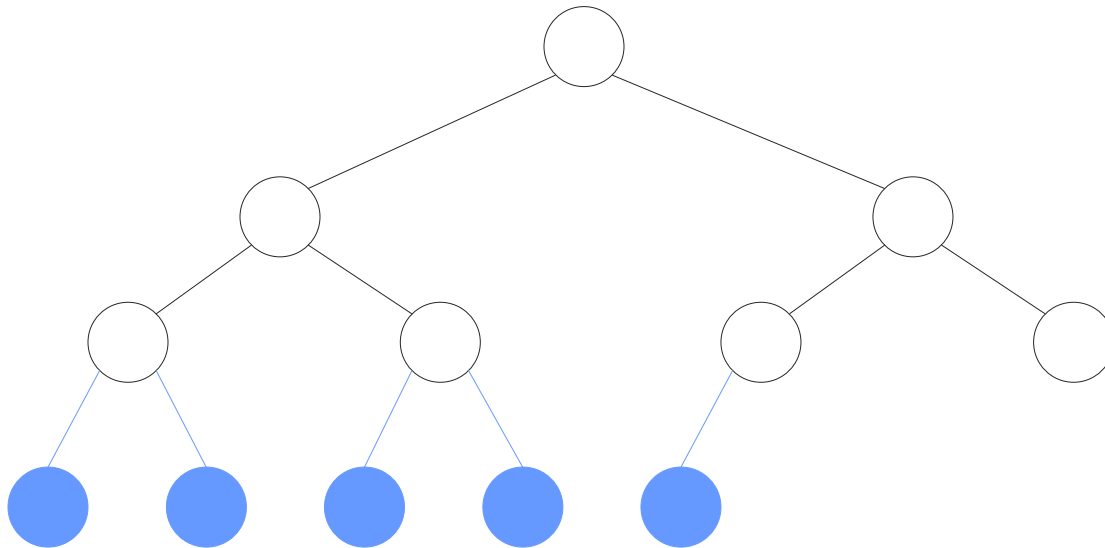
It is always wise to keep a tree **balanced**.

Not all node sets, however, can form a perfect tree. Hence, we propose

# **BINARY HEAPS**

# Binary Heap

- Heaps are “almost perfect binary trees”
  - All levels are full except possibly the lowest level
  - If the lowest level is not full, then nodes must be packed to the left



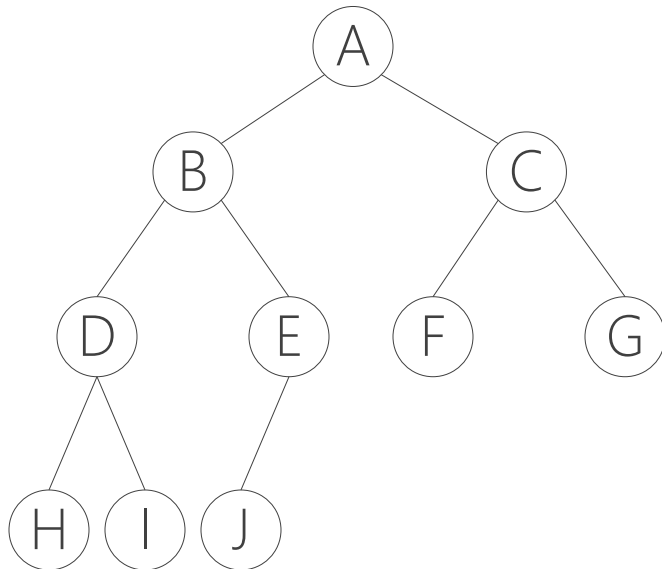
No “hole” from the first node to the last

# Property

- Given a binary heap of node number  $n$  and height  $h$ 
  - $n$  is within  $[2^h, 2^{h+1}-1]$
  - The height  $h=O(\log(n))$
  - The structure is so regular, it can be represented in an **array** and no links are necessary !!!

# Array Implementation of Binary Heaps

## Concept: A tree



## Implementation: An Array

A	B	C	D	E	F	G	H	I	J
0	1	2	3	4	5	6	7	8	9

Given a node  $x$  at position  $i$

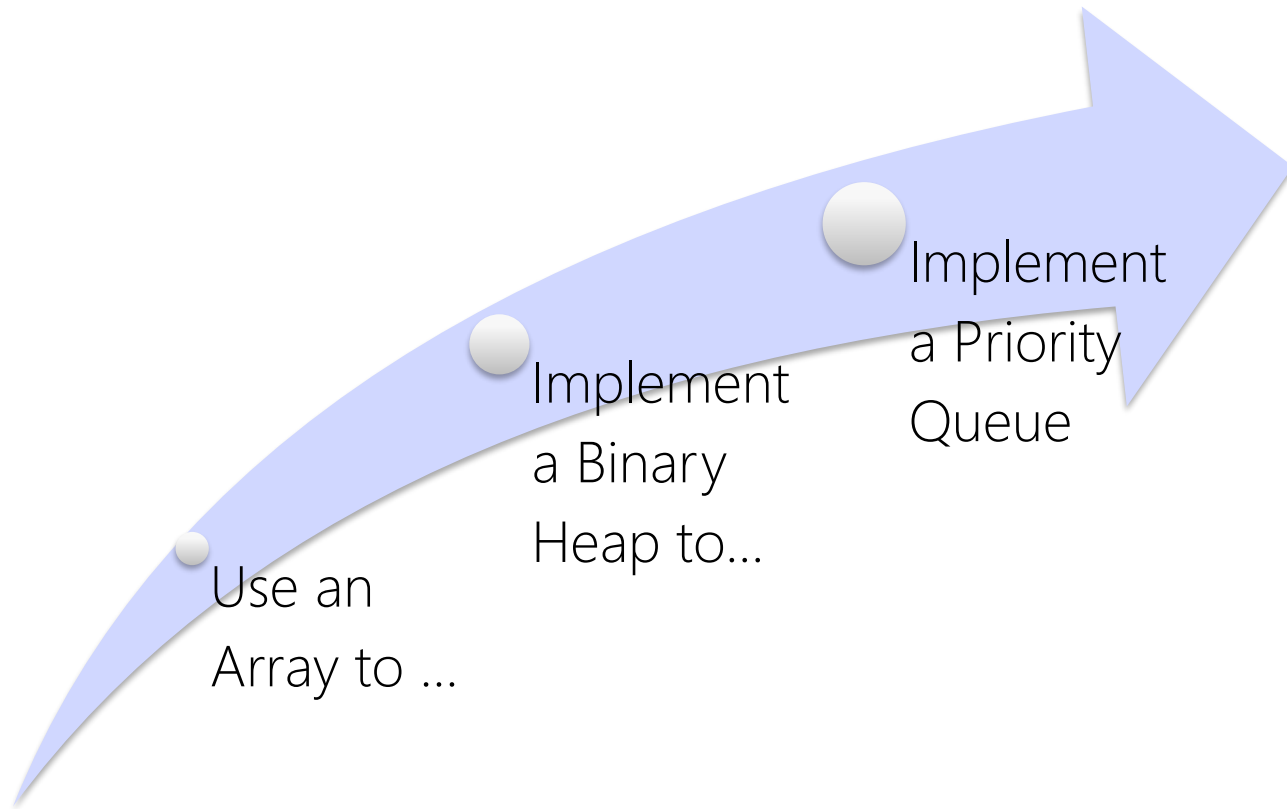
- $\text{left}(x)$  is at position  $2i+1$
- $\text{right}(x)$  is at position  $2i+2$
- $\text{parent}(x)$  is at position  $(i-1)/2$

Side Nodes

- It's not wise to store normal binary trees in arrays, coz it may generate many holes



# Implementation Flow

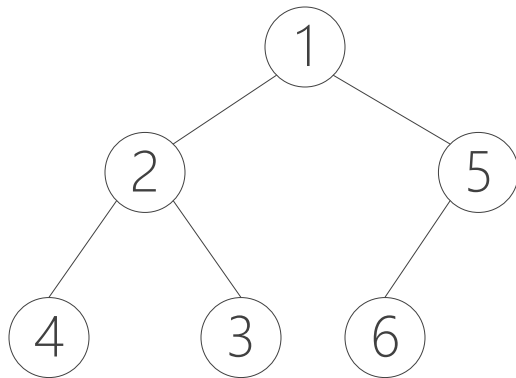


# A MINIMUM PRIORITY QUEUE HAS

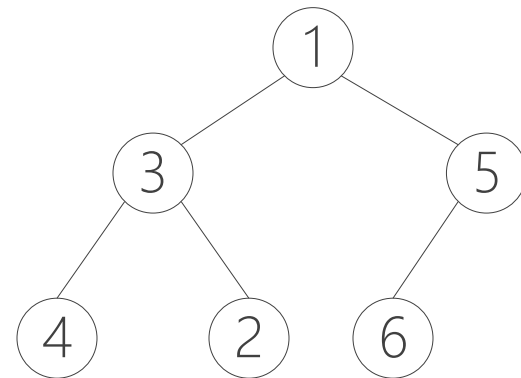
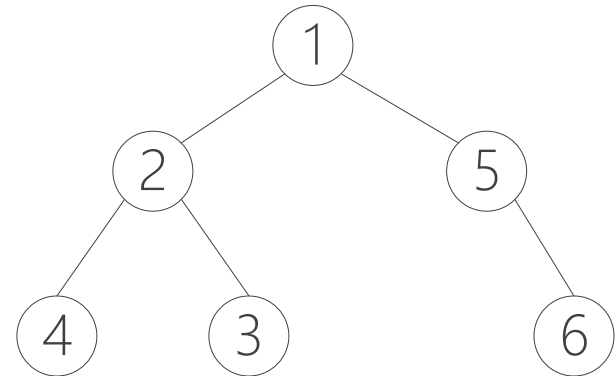
1. Binary Heap Structure
2. Heap Order Property
  - The value at each node is less than or equal to the values at both its descendants
  - The smallest node is always on the top

Use of binary heap is so common for priority queue implementations, thus the word heap is usually assumed to be the implementation of the data structure

## A Heap



## Not Heaps (WHY?)

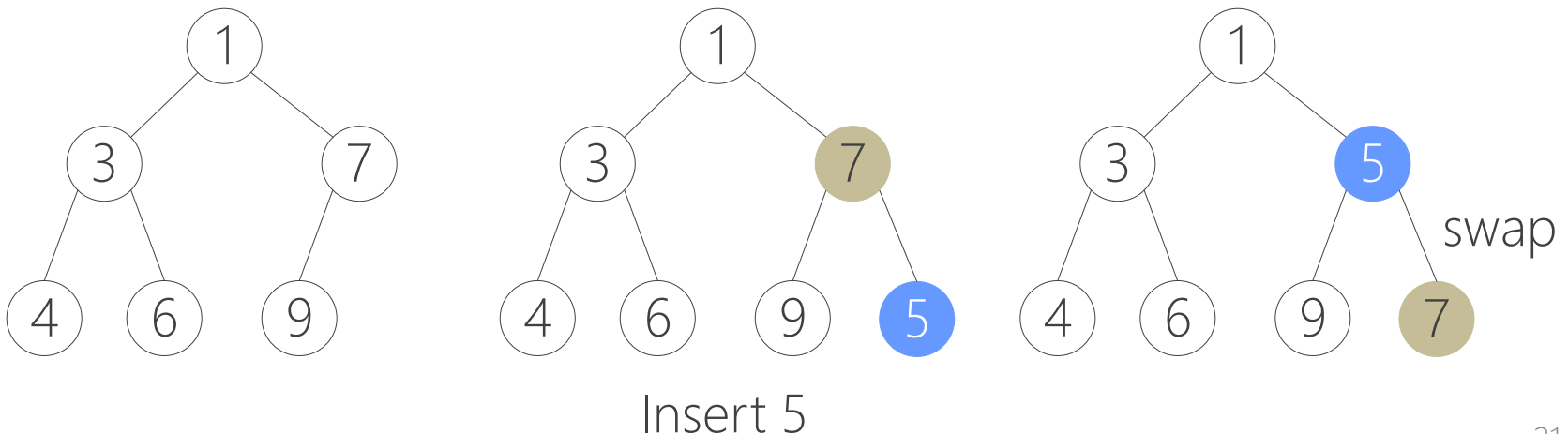


# Heap Properties

- Heap supports the following operations efficiently
  - Insert in  $O(\log N)$  time
  - Locate the current minimum in  $O(1)$  time
  - Delete the current minimum in  $O(\log N)$  time
- Note: After each insert/delete operation, the heap must remain a heap

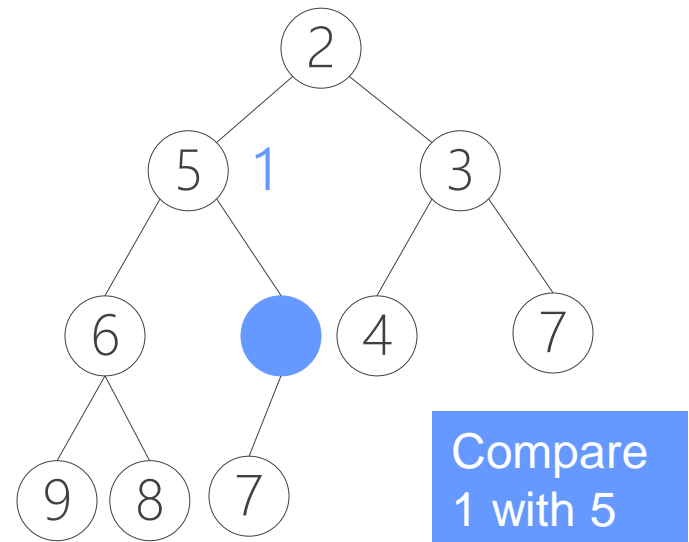
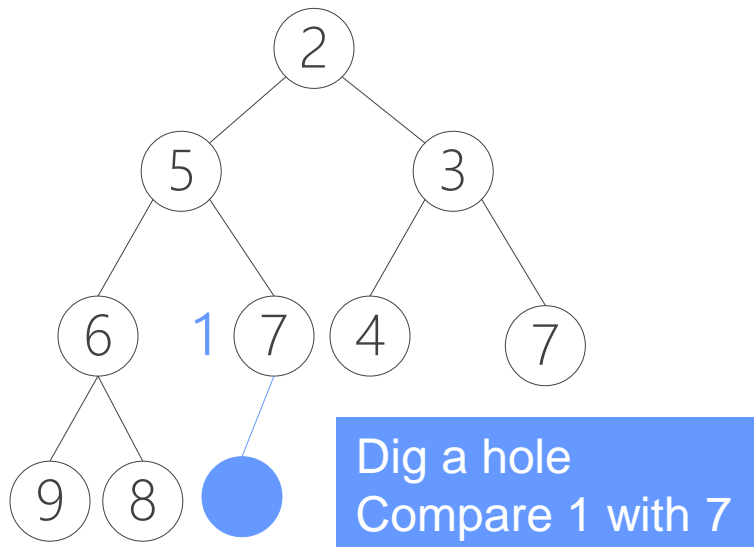
# Insertion

- Algorithm
  1. Add the new element to the next available position at the lowest level
  2. Restore the **min-heap property** if violated
    - General strategy is **percolate up**: if the parent of the element is larger than the element, then interchange the parent and child.

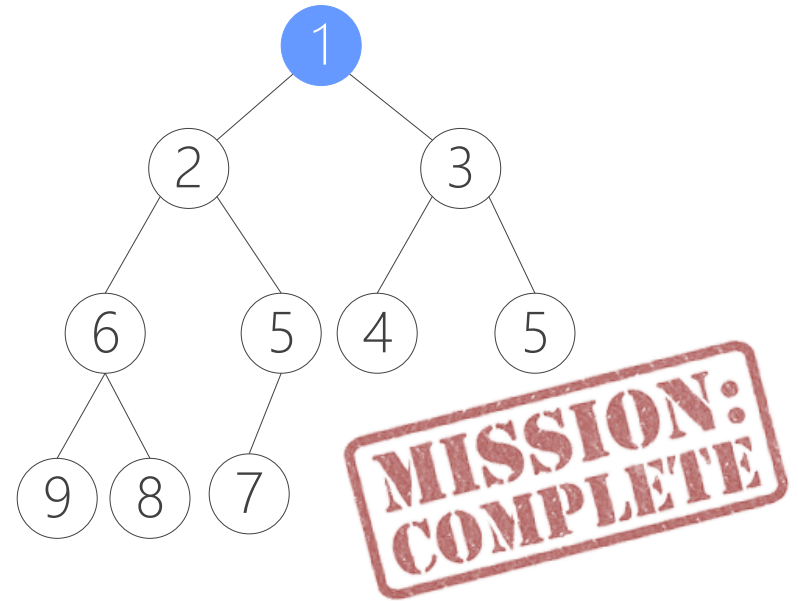
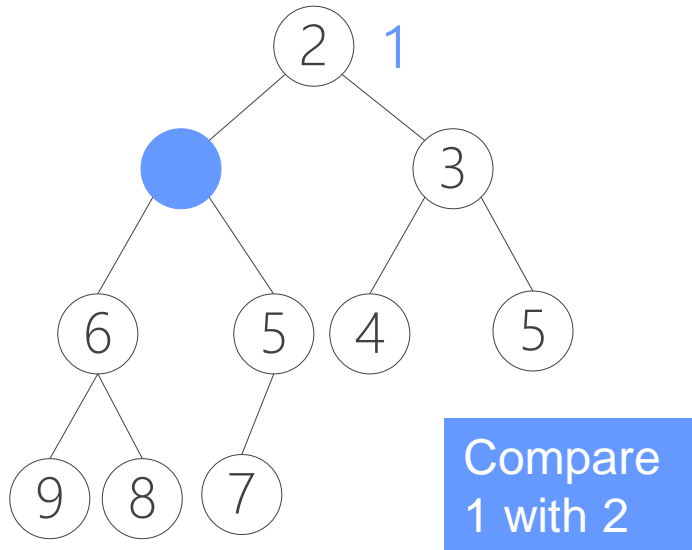


# An Implementation Trick

- Implementation of percolation in the insert routine
  - by performing **repeated swaps**: 3 assignment statements for a swap.
  - 3d assignments if an element is percolated up d levels
  - An enhancement: **Hole digging** with **d+1** assignments
- Insert 1...



# Insertion Complexity



Time Complexity =  $O(\text{height}) = O(\log N)$

# Insertion Pseudo Code

```
INSERT(A, size, x)
```

```
1. IF ISFULL(A)
```

```
2.     return False
```

```
3.     // percolate up
```

```
4.     hole = size++
```

```
5.     WHILE hole > 0 AND x < A[(hole-1)/2]
```

```
6.         A[hole] = A[(hole-1)/2]
```

```
7.         hole = (hole-1)/2
```

```
8.     A[hole] = x
```

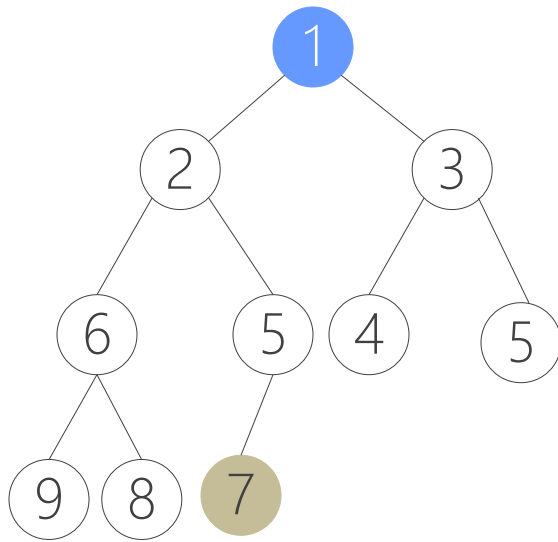
```
9.     return True
```



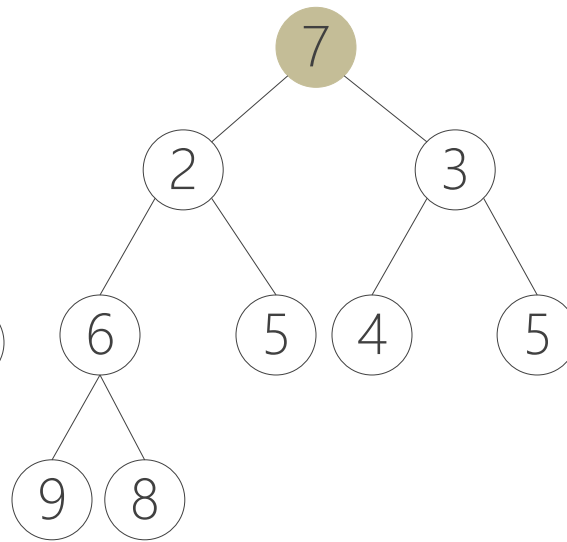
# deleteMin

- Same Strategy
  - First, maintain **binary heap structure**
    - Replace the root with the value of the **last node**
  - Then, maintain **heap order property**
    - Percolate **down**

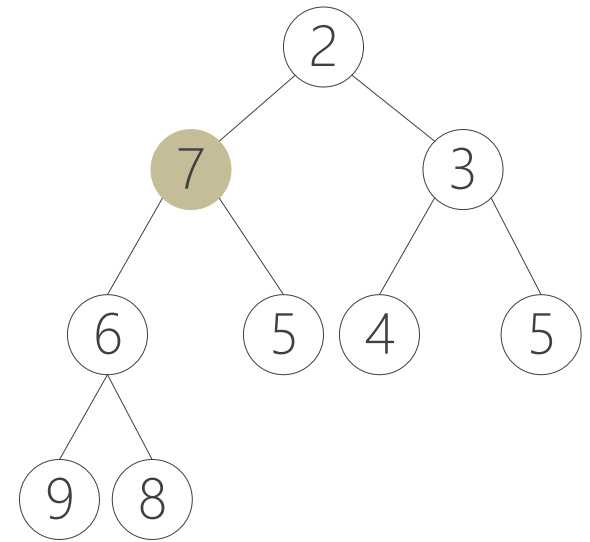
# deleteMin Example



deleteMin()  
called

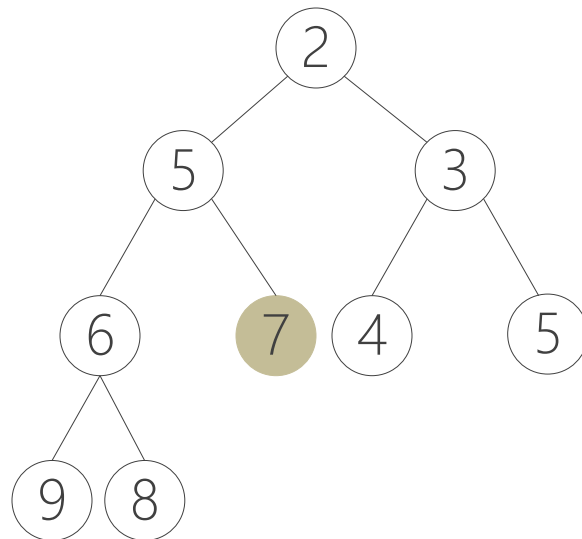


replace the  
root



swap with the  
smallest in the family

# deleteMin Example



**MISSION:  
COMPLETE**

swap with the  
smallest in the family

The “dig a hole” trick can be applied on delete, too!

## **HOLE TRICK**

# deleteMin Pseudo Code

DETELE-MIN(A, size)

1. IF ISEMPTY(A)
2.     return False
3.     min = A[0], hole = 0, x=A[--size]
4.     // percolate down
4.     WHILE A[hole] has children
5.         sid = index of A[hole]'s smaller child
6.         IF  $x \leq A[sid]$
7.             BREAK
8.         A[hole] = A[sid]
9.         hole = sid
10.     A[hole] = x
11.     return min

A sorting algorithm based on heaps

# HEAPSORT

# Heapsort

1. Build a binary heap of  $n$  elements
  - the minimum element is at the top of the heap
2. Perform  $n$  DeleteMin operations
  - the elements are extracted in sorted order
3. Record these elements in a second array and then copy the array back

$O(n \log(n))$

$O(n \log(n))$

$O(n)$  storage

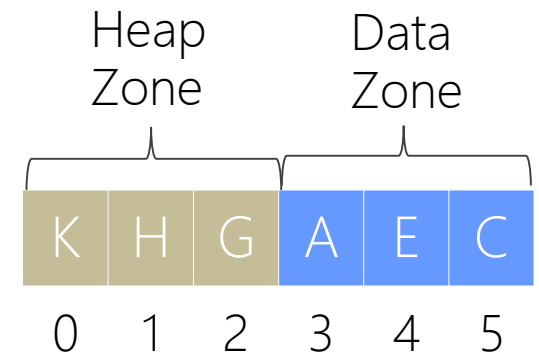
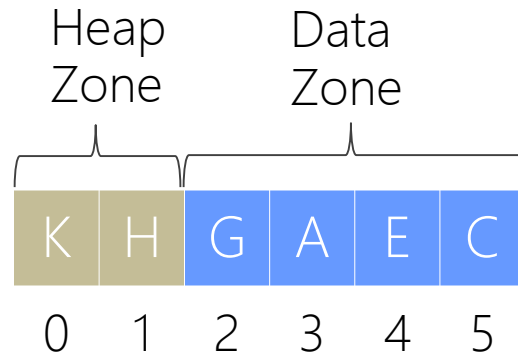
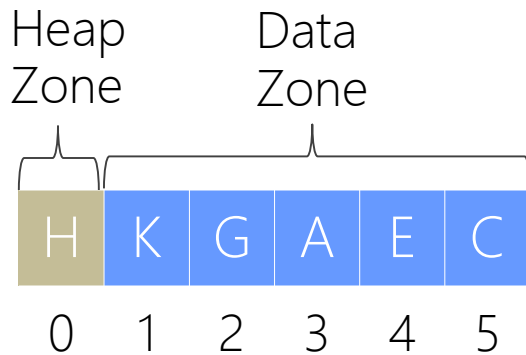
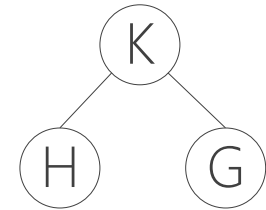
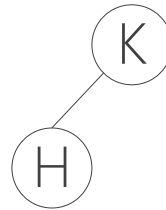
**Can we do better?**



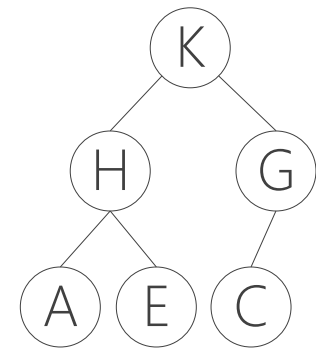
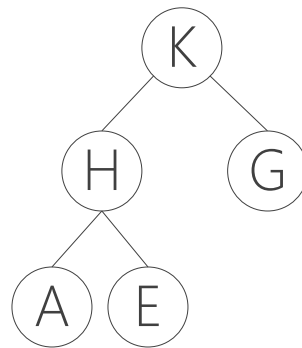
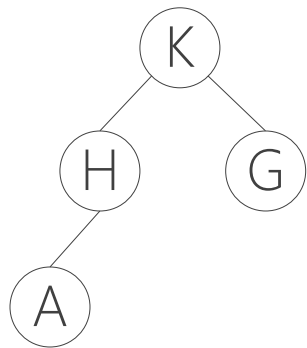
# Heapsort: No Extra Storage

- Observation: after each deleteMin, the size of heap shrinks by 1
  - We can use the last cell just freed up to store the element that was just deleted
  - after the last deleteMin, the array will contain the elements in decreasing order
- Further observation:
  - To sort the elements in decreasing order, use a min heap
  - To sort the elements in increasing order, use a max heap
    - Max Heap: the parent has a larger element than the child

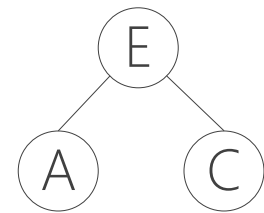
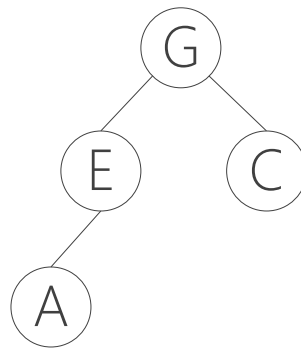
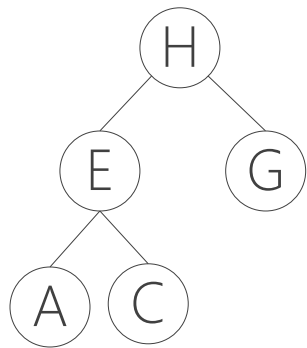
# Example: Heap Build-up



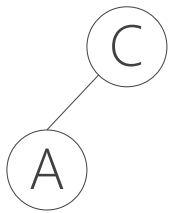
# Example: Heap Build-up



# Example: deteleMax



# Example: deleteMax



C	A	E	G	H	K
0	1	2	3	4	5

A	C	E	G	H	K
0	1	2	3	4	5

A	C	E	G	H	K
0	1	2	3	4	5

# Heapsort Pseudo Code

```
HEAPSORT(A, size)
1.   FOR i=0 TO size-1
2.       // maximum heap is used here
3.       INSERT(A, i, A[i])
4.   FOR i=size-1 TO 0
5.       A[i] = DELETE-MAX(A, i+1)
```

# Task

- Submit T8.cpp which includes at least three functions:
  - `void QuickSort(int *A, int left, int right)`
    - Sort sub-array  $A[\text{left}..\text{right}]$  using quick sort
    - Pivot is picked using median-of-3
    - Test on your computer and find the best **BASE CASE** for you
  - `void HeapSort(int *A, int n)`
    - $A$  is an array of integers and  $n$  is the size of  $A$
    - Sort  $A$  using heapsort
  - `int main(void)`
    - Generate an array,  $A1$ , consisting of  $10^5$  random integers
    - Generate another array  $A2$  which is identical to  $A1$
    - Sort  $A1$  using `QuickSort()` and  $A2$  using `HeapSort()`
    - Print the elapsed time in **milliseconds** during which both search functions run, respectively