

# 04-630

# Data Structures and Algorithms for Engineers

## Lecture 15: Priority Queues

*Adopted and Adapted from Material by:*

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# Agenda

- Last Class: Trees!
  - Block versus variable encoding
  - Optimal Versus Greedy heuristics
  - Prefix Trees – Huffman encoding



- Today: More Trees!
  - Priority queues
  - Binary heap
  - Applications
    - Heapsort



# Priority Queues

- Many applications require algorithms to process items in a specific order (e.g., relative importance).
  - One option: Use a list, **sort it**, and process in the resultant order(ascending or descending)
- Priority queues are more flexible
  - They allow new elements to be **added at arbitrary intervals**
  - **More efficient** to **add the new element in a priority queue** than to ***add*** to a list and ***re-sort***

$O(\log n)$

# Priority Queues

## Main priority queue operations

- *Insert* ( $Q, x$ )

Given an item  $x$  with a key  $k$ , insert it into the priority queue  $Q$

- *Find\_Minimum*( $Q$ ) or *Find\_Maximum*( $Q$ )

Return a pointer to the item whose key value is smaller / larger than any other key in the priority queue

- *Delete\_Minimum*( $Q$ ) or *DeleteMaximum*( $Q$ )

Remove the item from the priority queue  $Q$  whose key is *minimum* or *maximum*

heap-min

heap-max



# Priority Queues

## Possible implementations




- Unsorted array
- **Sorted array**: inserting new elements is slow.
- Balanced binary search tree
- **Binary heap**: suitable when you know upper bound of elements in priority queue (since size of array needs to be specified upfront)....but can mitigate this too using dynamic arrays.

# Priority Queues

Possible implementations



	Unsorted array	Sorted array	Balanced tree
Insert( $Q, x$ )	$O(1)$	$O(n)$	$O(\log n)$
Find-Minimum( $Q$ )	$O(1)$	$O(1)$	$O(1)$
Delete-Minimum( $Q$ )	$O(n)$	$O(1)$	$O(\log n)$



$\log n$

- How do we get  $O(1)$  for Find-Minimum( $Q$ ) in all three cases?
- Use a variable to store a pointer/index to the minimum entry in each of these structures
  - Update the pointer on each insertion (if necessary)
  - Update it on each deletion, requiring the new minimum to be found (but the cost of this can be folded into the cost of the deletion because it is the same cost as the deletion)



# Binary Heap

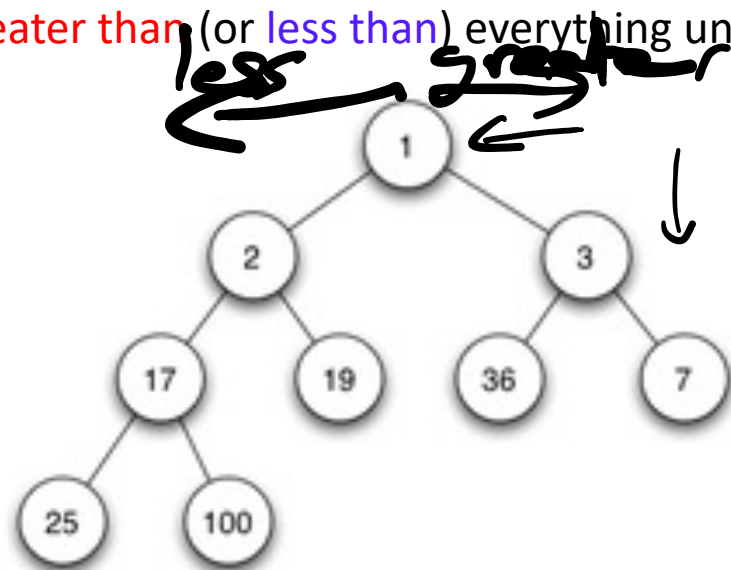
Binary Tree

Heaps maintain **partial order** on the set of elements

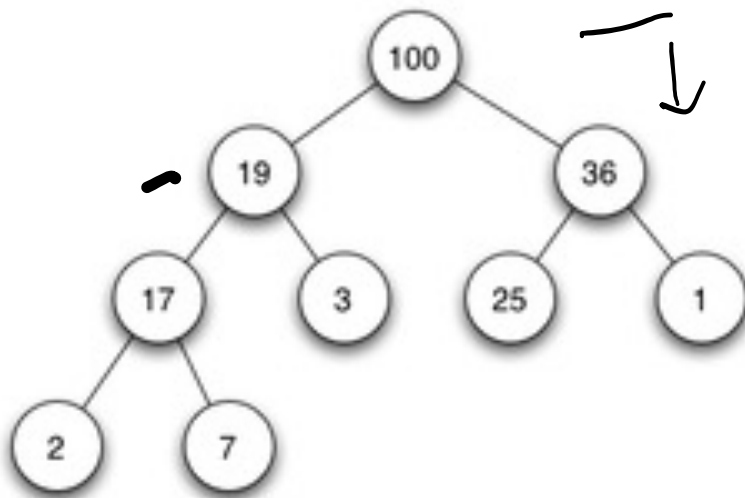
- Weaker than sorted order (& so it is efficient)
- Stronger than random order (& so min/max element can be quickly identified)
- “Heap” refers to being “top of the heap”
  - **Root Dominates Children:** is greater than (or less than) everything under it

Min-heap == less than  
Max-heap == greater than

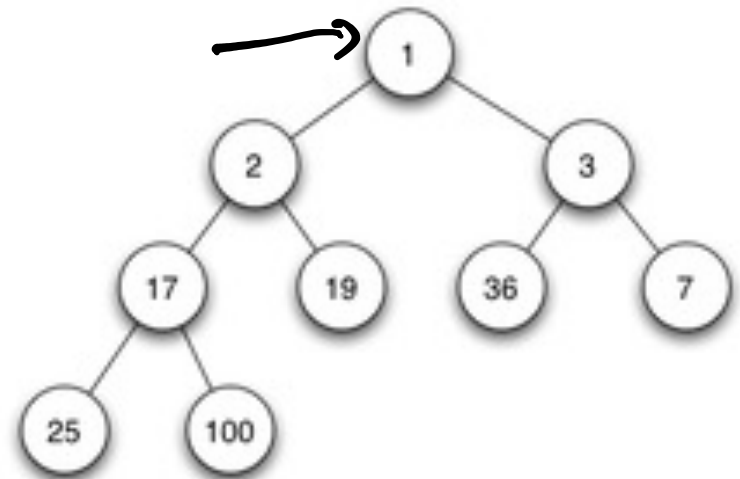
Heap-labelled tree is a binary tree  
(not a binary search tree)



# Binary Heap



Max-heap



Min-heap

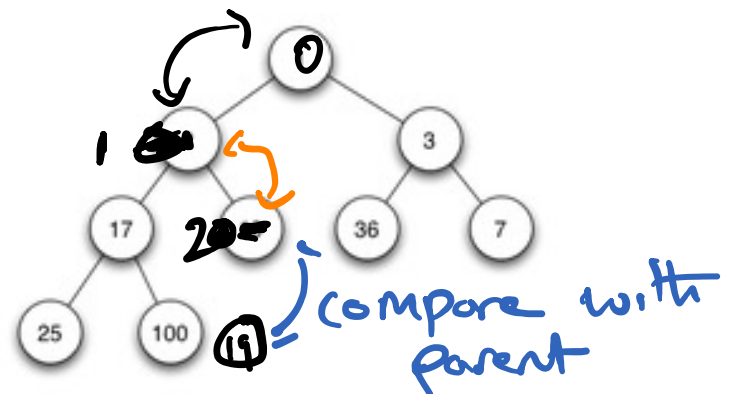
**Min-heap == root less than children**  
**Max-heap == root greater than children**



# Binary Heap

A **binary heap** is a **binary tree** that satisfies **two special shape and heap properties**:

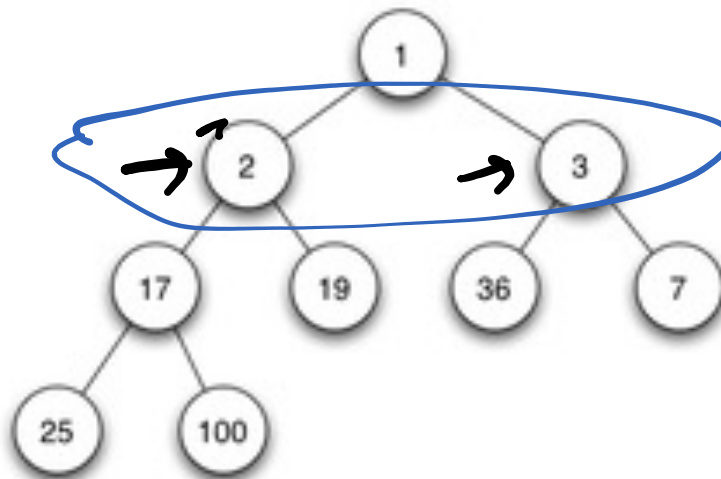
- all levels of the tree, except possibly the last one (deepest) are **fully filled**, and, if the last level of the tree is not complete, the nodes of that level are filled from **left to right**
- each node is “**greater than or equal to**” each of its children (in the case of a **max-heap**) according to some **comparison predicate** which is fixed for the entire data structure



# Binary Heap

The order of siblings is not specified

- Two children can be freely interchanged
- As long as it **doesn't violate** the **shape and heap** properties



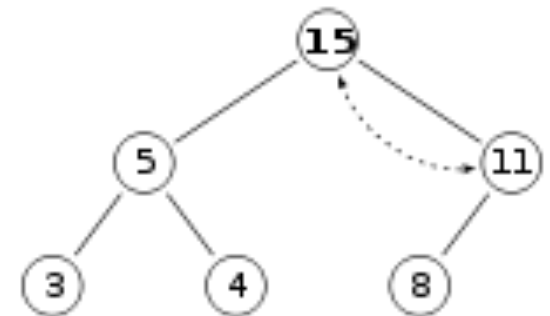
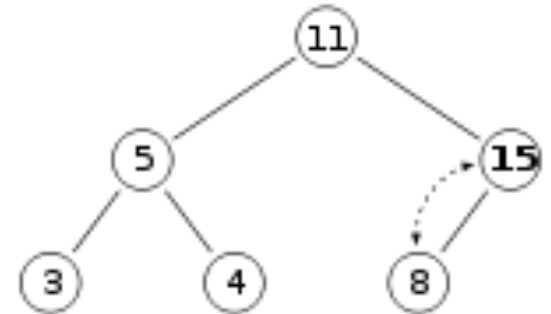
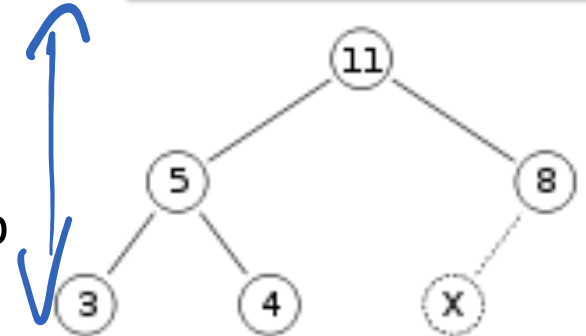
# Adding to a heap

Add 15 to max-heap

– Algorithm: **upheap** / **heapify-up** / sift-up

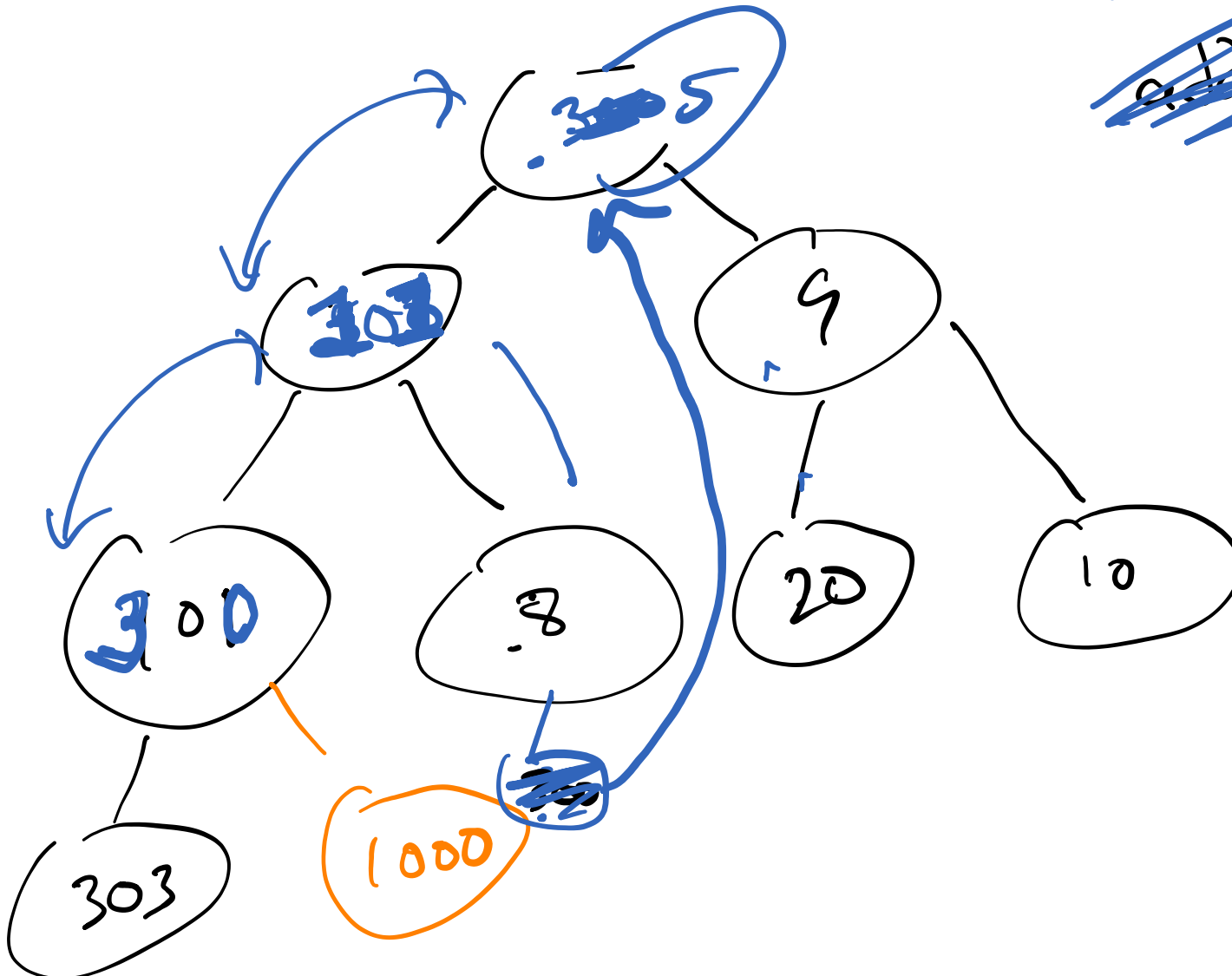
- Add element to bottom level
- Compare the added element with its parent;  
if they are in correct order, stop
- If not, swap the element with its parent  
and return to previous step

–  $O(\log n)$



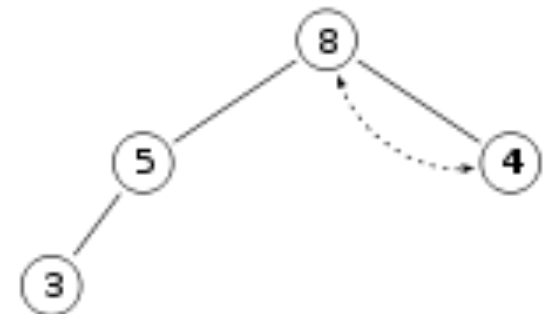
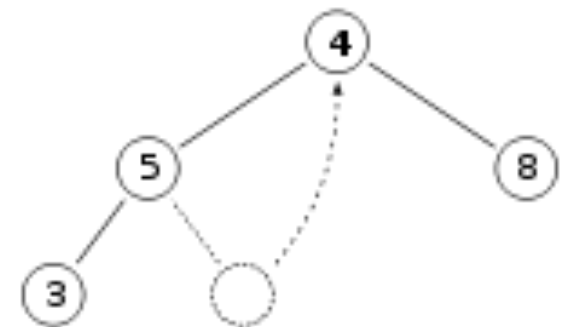
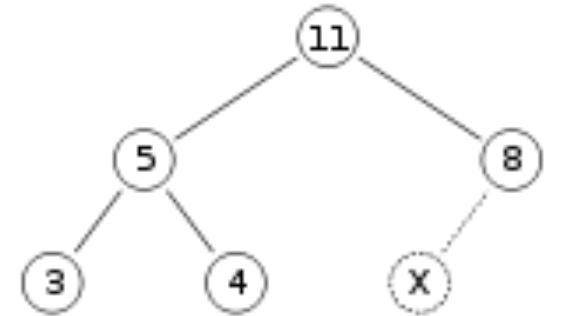
## Exercise

~~del\_min(1000)~~



# Deleting the root from a heap

- Effectively extracting the **maximum element** in a **max-heap** (or extracting the **minimum element** in **min-heap**)
- Algorithm: **downheap** / **heapify-down** / **sift-down**
  - Replace root with last element on the bottom level
  - Compare the swapped element with
    - The larger child (max-heap)
    - The smaller child (min-heap)
  - if they are in correct order, stop
  - If not, swap the element with the child and return to previous step
- $O(\log n)$



# Binary Heap

Implementation as a binary tree data structure

Problem: finding adjacent element on last level

- Find it algorithmically (takes time)
- Use additional links between siblings:  
threading the tree (takes space)

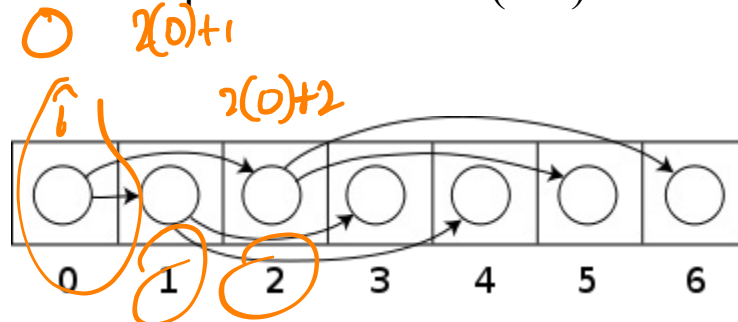
# Binary Heap

## Implementation as an array

- Represent a binary tree WITHOUT any pointers by using an array of keys and a **mapping function**
- Use formula to find parents and children of a node

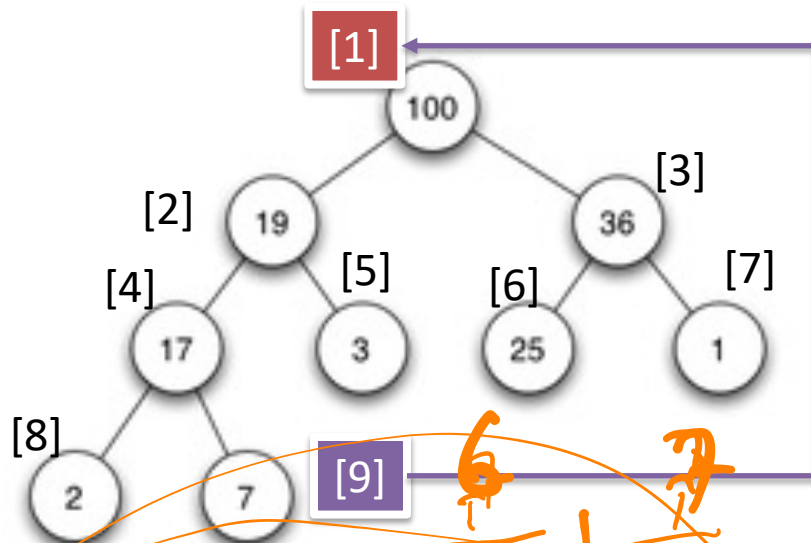
- Node at index  $i$  has children at indices  $2i + 1$  and  $2i + 2$

- Node at index  $i$  has parent at index  $(i - 1)/2$



# Deleting and moving last leaf item: max- & min-heaps

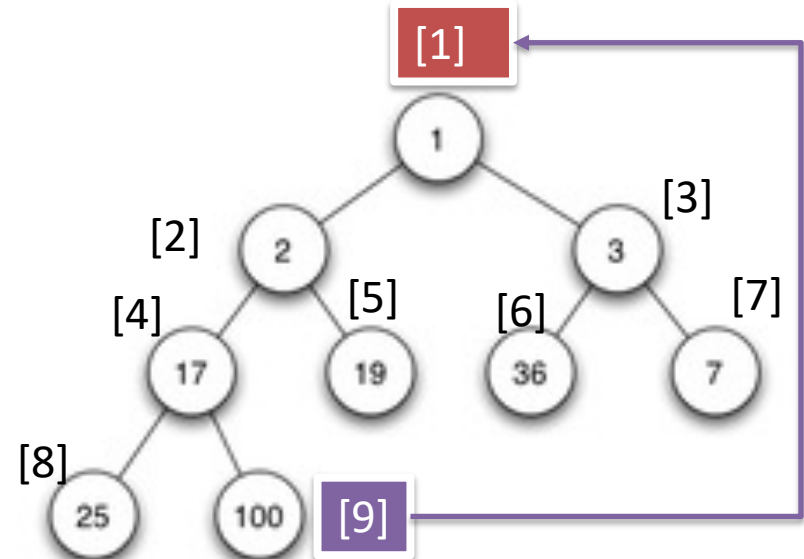
Delete 100, move 7, bubble down



[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]
100	19	36	17	3	25	1	2	7

Max-heap

Delete 1, move 100, bubble down



[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]
1	2	3	17	19	36	7	25	100

Min-heap

**Recall:** for index  $k$ ,  $\text{left\_child\_index} = 2k$ ,  $\text{right\_child\_index} = 2k+1$



# Applications of Priority Queues

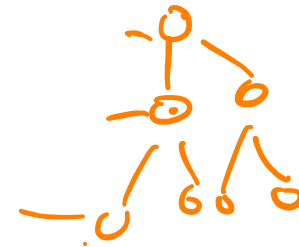
- Implementation of:
  - Sorting data, e.g., heapsort
  - Dijkstra's shortest path algorithms.
  - Huffman coding used in data compression.
  - minimum spanning tree algorithms e.g., Prim's algorithm.
  - solutions to fetch the next best or next worst element.
  - best first search algorithms e.g., A\* search (fetches next best).

# Example application: Heapsort

quick/  
max  
bubble  
selection  
insertion  
selection

- The heap priority queue can be used to create a very efficient sorting algorithm: heapsort

- Construct the priority queue:  $O(n \log n)$
- Repeatedly extract the minimum:  $O(n \log n)$



- Overall complexity is  $O(n \log n)$  worst-case
- This is the best that can be expected from any sorting algorithm
- Also, it is an in-place sort, meaning it uses no extra memory in addition the array containing the elements is to be sorted

$O(\log n)$

# Heapsort

```
heapsort(item_type s[], int n) {  
    int i; /* counters */  
    priority_queue q; /* heap for heapsort */  
    make_heap(&q,s,n); //populate priority queue  
    for (i=0; i<n; i++)  
        s[i] = extract_min(&q); //repeatedly extract the root  
}
```

↑

$\log n$

# Priority Queues Versus AVL-Trees

- Complete tree as possible
  - Different rules for insert/delete
  - Different goals
  - Different notions/definition of Balance

**Partial order:** is **greater than** (or **less than**) everything under it

**Order:** *Greater than left but less than right*

Delete Root: Replace it with last element on the bottom level

\* Compare the swapped elements to reheap

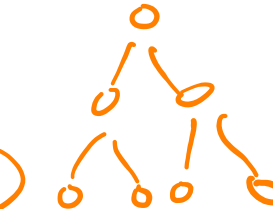
Add Node: to bottom level as next child

\* Compare the added element with its parent and swap to reheap

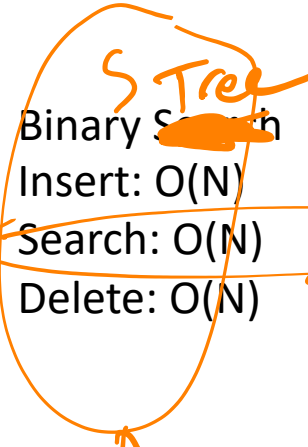
Delete Node with two children: Replace with smallest node in right subtree

Add Node: traverse to bottom level based on order then add to location then rebalance.

# Heap versus AVL (and BST)



Heap tree



Binary Search  
Insert:  $O(N)$   
Search:  $O(N)$   
Delete:  $O(N)$

AVL Tree  
Insert:  $O(\log N)$   
Search:  $O(\log N)$   
Delete:  $O(\log N)$

	Unsorted array	Sorted array	Balanced tree
Insert( $Q, x$ )	$O(1)$	$O(n)$	$O(\log n)$
Find-Minimum( $Q$ )	$O(1)$	$O(1)$	$O(1)$
Delete-Minimum( $Q$ )	$O(n)$	$O(1)$	$O(\log n)$

- Heap looks muchhhhhh better! Why not always use a heap?



Binary  
Tree



Binary  
Search  
Tree



AVL Tree  
(Balanced BST)



Red  
Black  
Tree



HuffMan  
(Prefix  
Tree)



Priority  
Heap



<https://imgur.com/gallery/ENrzhSV/comment/1050925723>

<https://iconscout.com/icon/deadpool-4411850>

# Acknowledgement

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*Augmented by material from:*

The Algorithm Design Manual 2<sup>nd</sup> Edition: by Steven Skiena

Introduction to Algorithms, 3<sup>rd</sup> Edition, Thomas H. Cormen et al. (2009)