

# Introduction to Algorithms and Data Structures

## Lecture 11: Heaps

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# Remainder of semester 1

Hello everyone! I will take over the teaching for the remainder of semester 1, and also a large part of semester 2.

Plan for (rest of) semester 1:

11. The Heap data structure
12. BuildHeap and HeapSort: running-time
13. QuickSort
14. Graphs I: graph data structures, Breadth-first search
15. Graphs II: DFS, connected components, TopSort

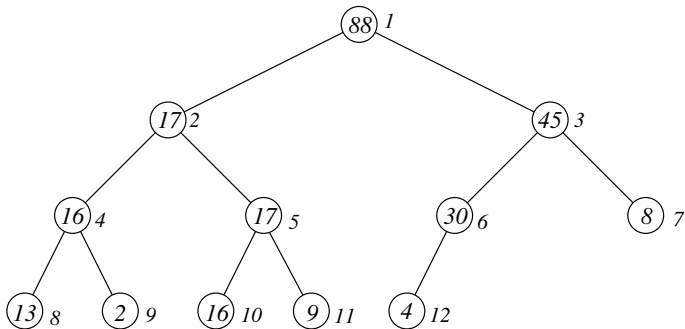
# The Heap

## Definition

A (max) heap is a “nearly complete” binary tree structure storing items in nodes, where every node is greater than or equal to each of its child nodes.

- ▶ The rule for parent/child key values is weaker over the tree as a whole than what we have for red-black trees, 2-3-4 trees or AVL trees (in those cases the tree encodes a total-ordering on the keys in the nodes).
- ▶ But ... the topology of a heap is more restricted than for those other tree structures - we have a binary tree with leaves appearing at depth  $h$  and depth  $h - 1$ , and all depth- $h$  leaves grouped together to the left.
- ▶ The heap does not (readily) carry total-order information, but is ideally set-up to efficiently answer “max” questions (suitable for priority queues).
- ▶ Neat structure of the topology means we can store the heap in an array.

## Example heap



88	17	45	16	17	30	8	13	2	16	9	4
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Direct mapping:  $k$ -th element of heap stored in index  $k - 1$ .

Can use  $(2^i - 1) + j - 1$  for index of  $j$ th element on level  $i$ .

(depends on “Almost-complete” property).

# Heaps: height and size

A heap is an **almost-complete** binary tree:

- ▶ All leaves are either at depth  $h - 1$  or depth  $h$  (where  $h$  is height).
- ▶ The depth- $h$  leaves all appear consecutively from left-to-right.

... A heap of height  $h$  has between  $2^h$  and  $2^{h+1} - 1$  nodes.

$$2^h \leq n \leq 2^{h+1} - 1.$$

Hence taking  $\lg$  across this inequality, we see

$$h \leq \lg(n) < h + 1.$$

This will put  $h$  in the range  $[\lg(n) - 1, \lg(n)]$ , ie  $\Theta(\lg(n))$ .

Lots of our Heap algorithms have worst-case running-time *directly* related to the height of the Heap.

# Main operations on a Heap

We imagine that the heap is stored in the array  $A$ .

**Heap-Maximum** Returns the max element of a Heap -  $\Theta(1)$  time.

**Max-Heapify** Runs in  $O(\lg(n))$  time and is used to **maintain** the (max) Heap property whenever some node/index  $i$  has violated the heap rule (but left subtree, right subtree are each legal Max Heaps).

**Heap-Extract-Max** Can return (and delete) the **maximum** item of a Heap in  $O(\lg(n))$  time.

**Max-Heap-Insert** Can insert a new item (and maintain the heap property) in  $O(\lg(n))$  time. Same for Heap-Increase-Key.

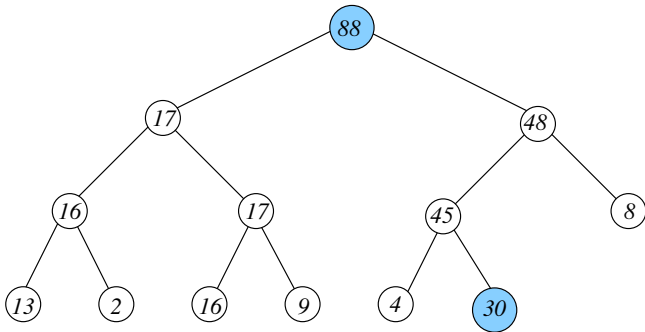
**Build-Max-Heap** Special one called Build-Max-Heap will run in  $O(n)$  time to build a Heap from scratch from an unordered input array.

## Max-Heapify and the other operations

The Max-Heapify operation (called at  $i$ ) is used to “fix-up” a Heap where the left-subtree  $\text{Left}(i)$  is a Heap, and so is the right-subtree  $\text{Right}(i)$  ... but the value at  $i$  violates the Heap property.

- ▶ We will show that Max-Heapify can be implemented in time  $O(h)$  for the height  $h$  of the heap, which is  $O(\lg(n))$ .  
(well, specifically, the height of the Heap rooted at  $i$ )
- ▶ We can then implement Heap-Extract-Max via the **trick** of just ...
  - ▶ Swapping  $A[0]$  (the max element) with  $A[A.\text{heap\_size} - 1]$  (the last item in the array, and decrementing  $A.\text{heap\_size}$ ).
  - ▶ Then calling Max-Heapify(0) on the Heap to “fix” the error at the root.
- ▶ Max-Heapify is also key to the implementation of Build-Max-Heap.

## Heap-Extract-Max



The main work is not returning the max element ( $\Theta(1)$  time) but removing the max from the tree.

We copy over the “last node” onto the root, then call Max-Heapify to fix things.



# Max-Heapify

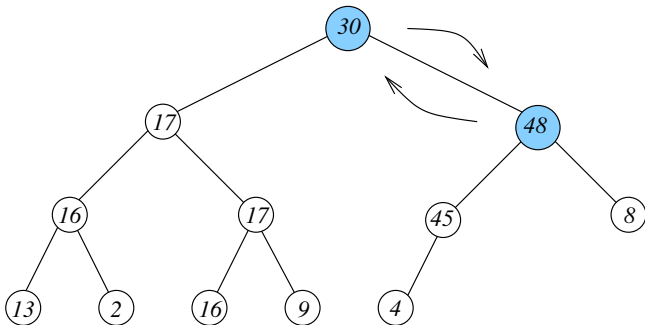
We assume that the “left-heap”  $\text{Left}(i)$  and the “right-heap”  $\text{Right}(i)$  are both accurate. Then  $\text{Max-Heapify}(i)$  will “patch-up” the heap from  $i$ .

**Algorithm**  $\text{Max-Heapify}(A, i)$

1.  $\ell \leftarrow \text{Left}(i)$
2.  $r \leftarrow \text{Right}(i)$
3.  $\text{largest} \leftarrow i$
4. **if**  $\ell < A.\text{heap\_size}$  **and**  $A[\ell] > A[i]$
5.      $\text{largest} \leftarrow \ell$
6. **if**  $r < A.\text{heap\_size}$  **and**  $A[r] > A[\text{largest}]$
7.      $\text{largest} \leftarrow r$
8. **if**  $\text{largest} \neq i$
9.     exchange  $A[i]$  with  $A[\text{largest}]$
10.     $\text{Max-Heapify}(A, \text{largest})$

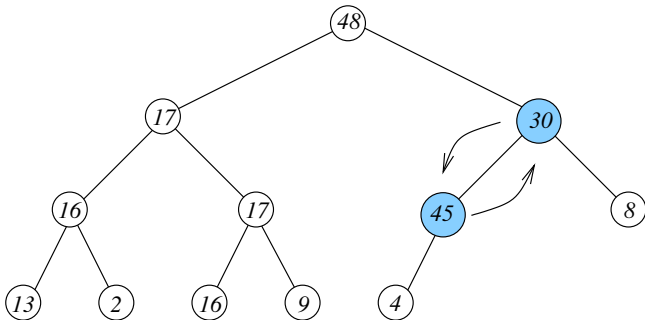
# Max-Heapify

We are calling Max-Heapify from the root node.



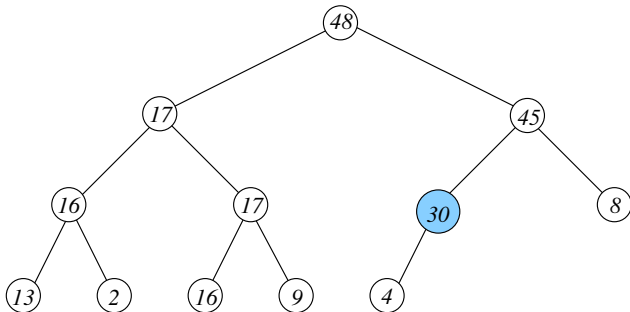
Max child of root is 48 on right, need to swap, and then recursively call Max-Heapify on 30 as the child (as in line 10. of the Algorithm).

## Max-Heapify ...



Max child of 30 is 45 on left, need to swap,  
and then call heapify on 30 as the child.

## Max-Heapify ...



Max child of 30 is 4, less than 30. ok. Finish.

# Max-Heap-Insert

**Algorithm** Max-Heap-Insert( $A, k$ )

1.  $A.heap\_size \leftarrow A.heap\_size + 1$
2.  $A[heap\_size - 1] \leftarrow k$ .
3.  $j \leftarrow heap\_size - 1$
4. **while** ( $j \neq 0$  **and**  $A[j] > A[Parent(j)]$ ) **do**
5.     exchange  $A[j]$  and  $A[Parent(j)]$
6.      $j \leftarrow Parent(j)$

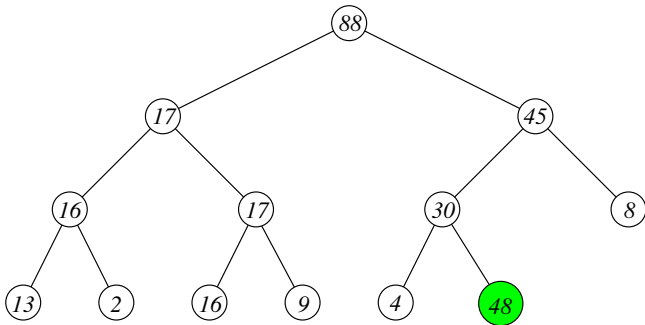
“Bubble” the item up the tree.

Basically swap  $k$  with  $A[Parent(j)]$  if  $k$  is bigger.

Why is this correct??

Takes  $\Theta(1)$  for adding new last node (initially), and  $\Theta(1)$  for every swap. Hence  $\Theta(\lg n)$  worst-case in total.

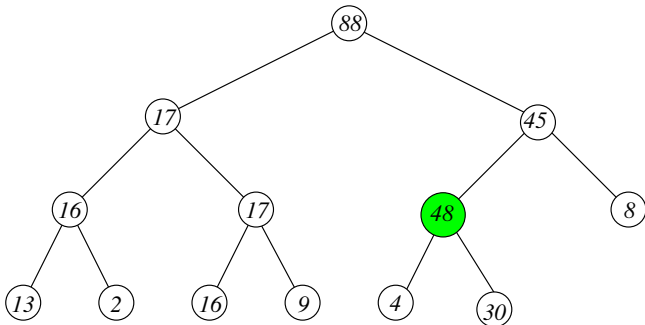
## Max-Heap-Insert



Max-Heap-Insert(48), first add at “last node”.

Need to swap 48 with parent 30, because  $48 > 30$ .

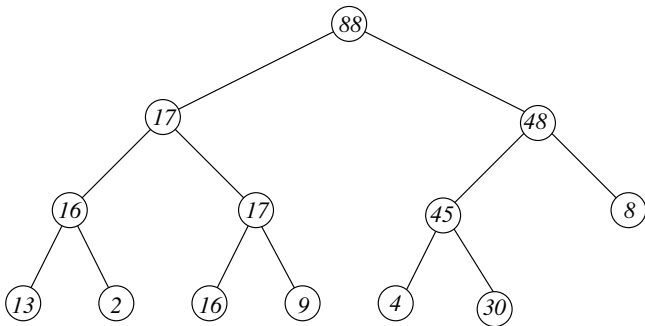
## Max-Heap-Insert



48 has now moved-up

Now need to swap 48 with parent 45, because  $48 > 45$ .

## Max-Heap-Insert



Done. 48 is less than root 88, no swap needed.



# Priority Queues

A **Priority queue** is a Data Structure for storing collections of elements. They differ in their access policy compared to Lists, Stacks and Queues:

- ▶ Every element is associated with a *key*, which is taken from some linearly ordered set, such as the integers.
- ▶ Keys represent **priorities**:

A larger key means a higher priority.

Classic application is for access to resources like printers, when different users may have varying priority levels.

# Priority Queue operations

Methods of *PriorityQueue*:

- ▶ `insertItem( $k$ ,  $e$ )`: Insert element  $e$  with key  $k$ .
- ▶ `maxElement()`: Return an element with maximum key; an error occurs if the priority queue is empty.
- ▶ `removeMax()`: Return and remove an element with maximum key; an error occurs if the priority queue is empty.
- ▶ `isEmpty()`: Return `TRUE` if the priority queue is empty and `FALSE` otherwise.

No `findElement( $k$ )` or `removeItem( $k$ )` methods.

# Implementations of Priority Queues

Observation:

*The maximum key in a binary search tree (like a Red-Black tree) is always stored in the rightmost leaf.*

Therefore, all Priority Queue methods can be implemented on an Red-Black tree with running time  $\Theta(\lg(n))$  (except isEmpty which is  $\Theta(1)$ ).

However, using a Max Heap we can implement maxElement with Heap-Maximum in  $\Theta(1)$  time, while still having insertItem (via Max-Heap-Insert) and removeMax (via Heap-Extract-Max) in  $\Theta(\lg(n))$  time.

*Note Balanced Search trees can be “tweaked” to maintain a direct pointer to the rightmost leaf, to give  $\Theta(1)$  for maxElement.*

# Reading Material

This lecture used content from sections 6.1, 6.2 and 6.3 of [CLRS]:

- ▶ I did Max-Heap-Insert more directly than the book.
- ▶ I didn't write the details of Parent, Left, Right on slides (tutorial qn).

In lecture 12, I will cover:

- ▶ The method Build-Heap
- ▶ The asymptotic analysis of the running-time of the Heap algorithms (6.1-6.3 of [CLRS])
- ▶ Heapsort and its running time (6.4 of [CLRS])