

# IE170: Algorithms in Systems Engineering: Lecture 9

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## Taking Stock

### Last Time

- Binary Search Trees
- Java Collections Interfaces: Maps
- Heap != Binary Search Tree

### This Time

- Heaps
- Heap Sort



## Heaps

- A **heap** is a balanced binary tree with additional structure that allows it to function efficiently as a **priority queue**.
- There are two types of heaps: max and min. In lecture, I'll stick to max

### Priority Queue (Max)

- INSERT( $x$ )
- MAXIMUM()
- $x = \text{EXTRACT-MAX}()$
- INCREASE-KEY( $x, k$ )



## Heaps

- Heaps are a bit like binary search trees, however, they enforce a **different** property

### Heap Property: Children are Horrible!

- In a max-heap, the key of the parent node is always at least as big as its children:

$$k(p(x)) \geq k(x) \quad \forall x \neq \text{root}$$

- Children are **great** in min-heaps



## How to Keep the Heap Property?

- Consider a tree in which **all nodes except for one** have the heap property.
- We can transform this into a tree in which every node has the heap property.
- This operation is called `HEAPIFY()`.



## Heapify

### HEAPIFY( $x$ )

- 1 Find largest of  $k(x)$ ,  $k(\ell(x))$ ,  $k(r(x))$
- 2 If  $k(x)$  is largest, you are done
- 3 Swap  $x$  with largest node, and call `HEAPIFY()` on the new subtree

- Intuition behind analysis: Heap is binary tree, so  $\leq \lg n$  levels. There is a constant amount of work at each level: comparing three items and swapping two.
- $\Rightarrow$  `HEAPIFY` a node in  $O(\lg n)$
- Alternatively, `HEAPIFY` node of height  $h$  is  $O(h)$ 
  - Height of node: number of edges on path to leaf



## To Build a Heap

- By calling `heapify()` on each node, starting at the next to last level and working upward, we can transform an unordered binary tree into a heap.

### Analysis

- $O(n)$  calls to `HEAPIFY`, each of which takes  $O(\lg n)$   
 $\Rightarrow n \lg n$
- But we can do better!



## Building A Heap – Analysis

- Note that `HEAPIFY` really takes  $O(h)$  on a node of height  $h$
- There aren't "too many" high nodes. In fact, there are  $\leq \lceil n/(2^{h+1}) \rceil$
- Total Running Time is no more than

$$\sum_{h=1}^{\lg n} \lceil \frac{n}{2^{h+1}} \rceil O(h) = O\left(n \sum_{h=0}^{\lg n} \frac{h}{2^h}\right).$$

- Since  $\sum_{h=0}^{\infty} h/2^h = 2$ , running time to make a heap is  $O(n)$ .



## Operations on a Heap

- The node with the highest key is always the root.
- To **delete** a record
  - Exchange its record with that of a leaf.
  - Delete the leaf.
  - Call `heapify()`.
- To **add** a record
  - Create a new leaf.
  - Exchange the new record with that of the parent node if it has a higher key.
  - This is like insertion sort – just move it up the path...
  - Continue to do this until all nodes have the heap property.
  - Note that we can **change the key** of a node in a similar fashion.



## Time for Heap Operations

CREATE	$O(n)$
MAXIMUM	$\Theta(1)$
HEAPIFY	$O(\lg n)$ , or $O(h)$
EXTRACT-MAX	$O(\lg n)$
HEAP-INCREASE-KEY	$O(\lg n)$
INSERT	$O(\lg n)$



## Heap Sort

- Suppose the list of items to be sorted are in an array of size  $n$
- The heap sort algorithm is as follows.
  - 1 Put the array in heap order as described above.
  - 2 In the  $i^{\text{th}}$  iteration, exchange the item in position 0 with the item in position  $n - i$  and call `heapify()`.
- Why is this correct?
- What is the running time?



## Next Time?

- Review, Review, Review.
- We have covered chapters 1-4, 6, 10-11, and Appendices A and B: **That's a lot!**

### News

- Homework due 2/5 – No late homework – We do review on 2/5
- Quiz on 2/7



# Bear Down, Chicago Bears!

