

# Data Structures and Algorithms

*CS245-2015S-08*

## *Priority Queues – Heaps*

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# 08-0: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

Keys are “priorities”, with smaller keys having a “better” priority

# 08-1: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

## Implementation:

- Sorted Array
  - Add Element
  - Remove Smallest Key

# 08-2: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

## Implementation:

- Sorted Array
  - Add Element  $O(n)$
  - Remove Smallest Key  $O(1)$   
(using circular array)

# 08-3: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

## Implementation:

- Binary Search Tree
  - Add Element
  - Remove Smallest Key

# 08-4: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

## Implementation:

- Binary Search Tree
  - Add Element  $O(\lg n)$
  - Remove Smallest Key  $O(\lg n)$

*If the tree is balanced*

# 08-5: Priority Queue ADT

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## Operations

- Add an element / key pair
- Return (and remove) element with smallest key

## Implementation:

- Binary Search Tree
  - Add Element  $O(n)$
  - Remove Smallest Key  $O(n)$

Computer Scientists are Pessimists

(Murphy was right)

## 08-6: **Heap Definition**

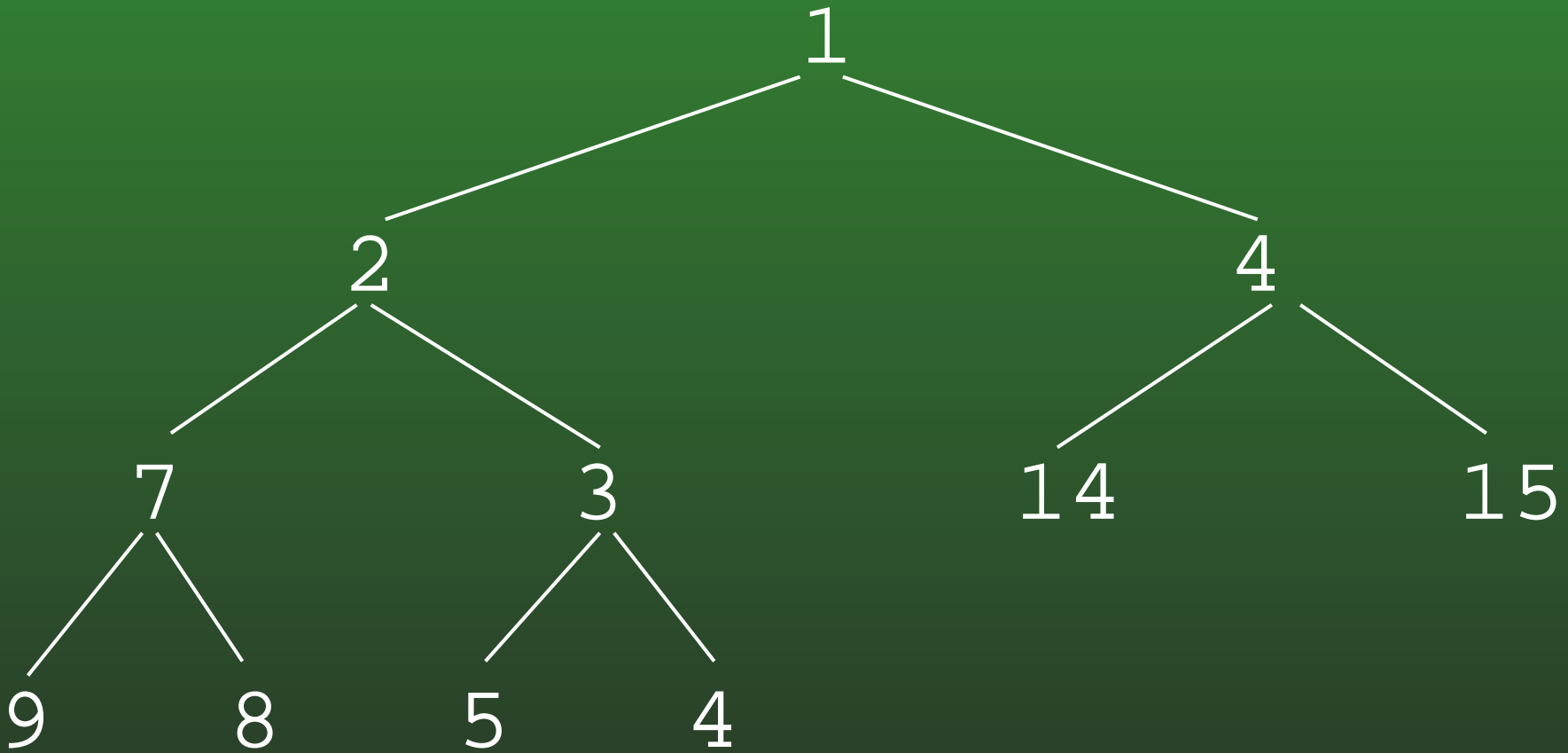
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- Complete Binary Tree
- Heap Property
  - For every subtree in a tree, each value in the subtree is  $\geq$  value stored at the root of the subtree



# 08-7: Heap Examples

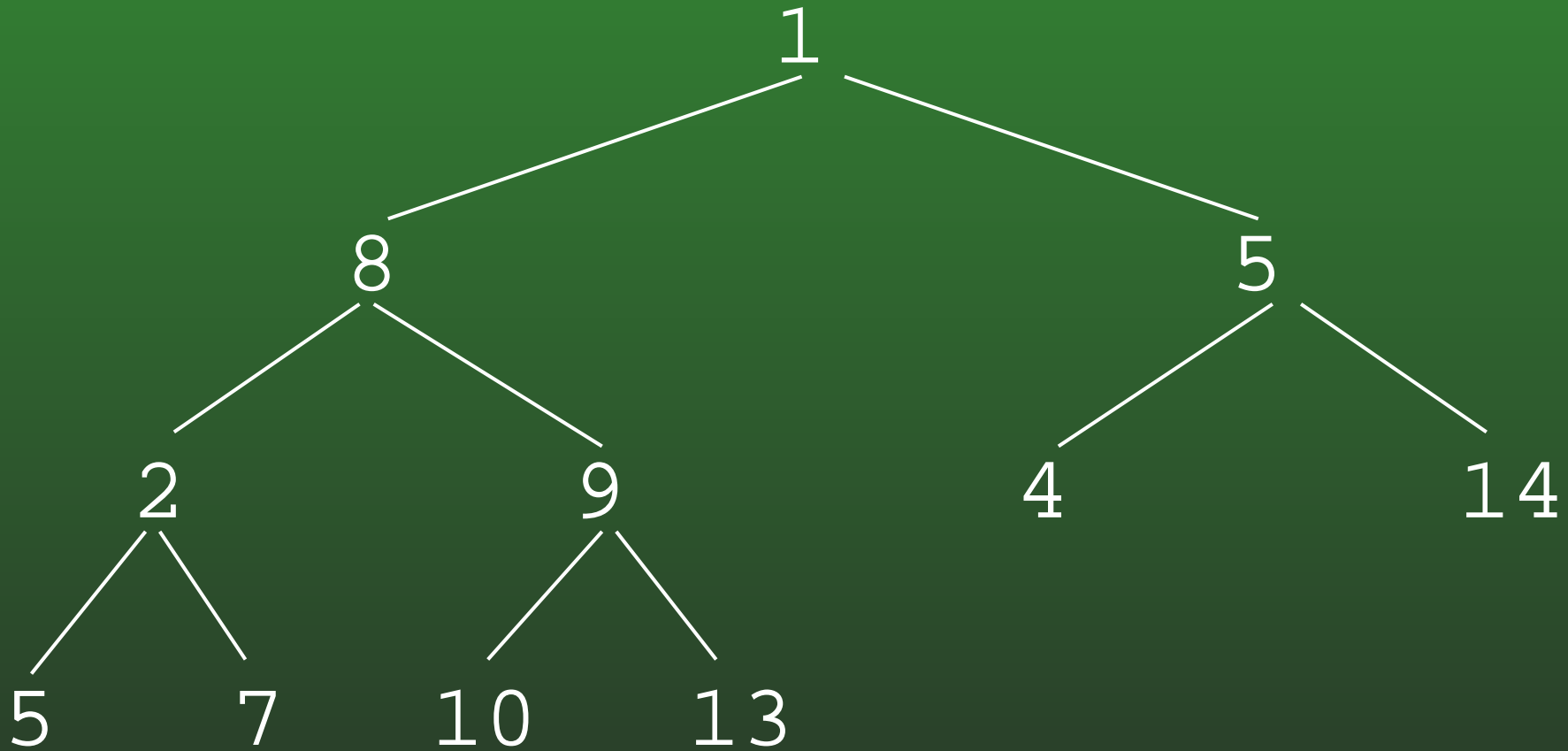
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Valid Heap

# 08-8: Heap Examples

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Invalid Heap

## 08-9: Heap Insert

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- What is the only place we can insert an element in a heap, and maintain the complete binary tree property?

## 08-10: Heap Insert

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- What is the only place we can insert an element in a heap, and maintain the complete binary tree property?
  - “End” of the tree – as a child of the shallowest leaf that is farthest to the left
  - Will the resulting tree still be a heap?

# 08-11: Heap Insert

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- What is the only place we can insert an element in a heap, and maintain the complete binary tree property?
  - “End” of the tree – as a child of the shallowest leaf that is farthest to the left
- Inserting an element at the “end” of the heap may break the heap property
  - Swap the value up the tree (examples)

# 08-12: **Heap Insert**

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- Running time for Insert?

## 08-13: Heap Insert

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- Running time for Insert?
  - Place element at end of tree:  $O(1)$  (We'll see a clever way to find the "end" of the tree in a bit)
  - Swap element up the tree:  $O(\text{height of tree})$  (Worst case, swap all the way up to the root)
    - Height of a Complete Binary Tree with  $n$  nodes?

## 08-14: Heap Insert

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- Running time for Insert?
  - Place element at end of tree:  $O(1)$  (We'll see a clever way to find the "end" of the tree in a bit)
  - Swap element up the tree:  $O(\text{height of tree})$  (Worst case, swap all the way up to the root)
    - Height of a Complete Binary Tree with  $n$  nodes =  $\Theta(\lg n)$
- Total running time:  $\Theta(\lg n)$  in the worst case



# 08-15: Heap Remove Smallest

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- Finding the smallest element is easy – at the root of the tree
- Removing the Root of the heap is hard
- What element is easy to remove? How could this help us?

# 08-16: Heap Remove Smallest

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- Finding the smallest element is easy – at the root of the tree
- Removing the Root of the heap is hard
- Removing the element at the “end” of the heap is easy
  - Copy last element of heap into root
  - Remove the last element
    - Problem?

# 08-17: Heap Remove Smallest

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- Finding the smallest element is easy – at the root of the tree
- Removing the Root of the heap is hard
- Removing the element at the “end” of the heap is easy
  - Copy last element of heap into root
  - Remove the last element
    - May break the heap property

# 08-18: Heap Remove Smallest

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- Finding the smallest element is easy – at the root of the tree
- Removing the Root of the heap is hard
- Removing the element at the “end” of the heap is easy
  - Copy last element of heap into root
  - Remove the last element
    - Push the root down, until heap property is satisfied

# 08-19: **Heap Remove Smallest**

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- Running time for remove smallest?

## 08-20: Heap Remove Smallest

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- Running time for remove smallest?
  - Copy last element into root, remove last element:  $O(1)$ , given a  $O(1)$  time method to find the last element
  - Push the root down:  $O(\text{height of the tree})$   
(Worst case, push element all the way down)
    - As before, Complete Binary Tree with  $n$  elements has height  $\Theta(\lg n)$
- Total time:  $\Theta(\lg n)$  in the worst case

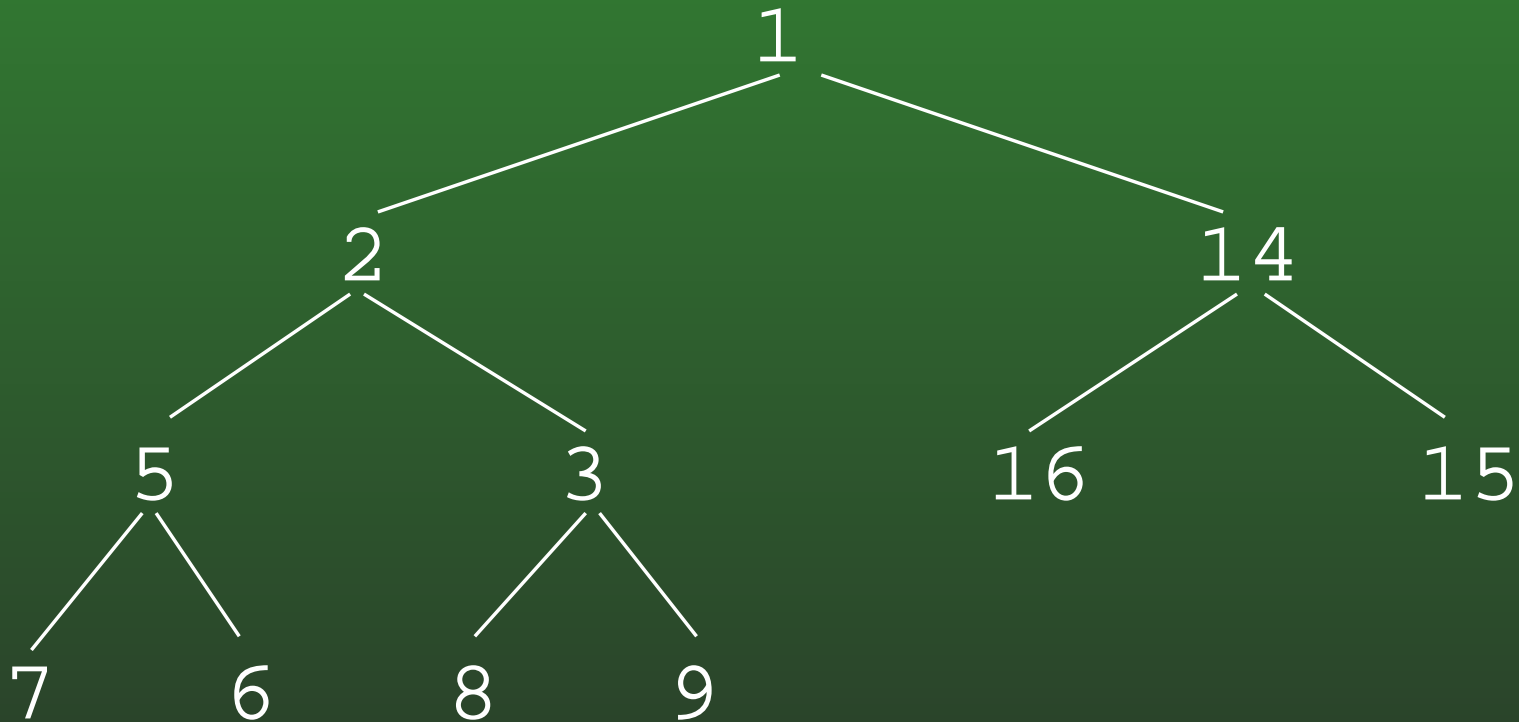
# 08-21: Representing Heaps

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- Represent heaps using pointers, much like BSTs
  - Need to add parent pointers for insert to work correctly
  - Need to maintain a pointer to the location to insert the next element (this could be hard to update & maintain)
  - Space needed to store pointers – 3 per node – could be greater than the space need to store the data in the heap!
  - Memory allocation and deallocation is slow
- There is a better way!

# 08-22: Representing Heaps

A Complete Binary Tree can be stored in an array:



	1	2	14	5	3	16	15	7	6	8	9		
0	1	2	3	4	5	6	7	8	9	10	11	12	13



# 08-23: CBTs as Arrays

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- The root is stored at index 1
- For the node stored at index  $i$ :
  - Left child is stored at index  $2 * i$
  - Right child is stored at index  $2 * i + 1$
  - Parent is stored at index  $\lfloor i/2 \rfloor$

# 08-24: CBTs as Arrays

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Finding the parent of a node

```
int parent(int n) {  
    return (n / 2);  
}
```

Finding the left child of a node

```
int leftchild(int n) {  
    return 2 * n;  
}
```

Finding the right child of a node

```
int rightchild(int n) {  
    return 2 * n + 1;  
}
```

# 08-25: Building a Heap

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Build a heap out of  $n$  elements

# 08-26: Building a Heap

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Build a heap out of  $n$  elements

- Start with an empty heap
- Do  $n$  insertions into the heap

```
MinHeap H = new MinHeap();  
for(i=0 < i<A.size(); i++)  
    H.insert(A[i]);
```

Running time?

# 08-27: Building a Heap

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Build a heap out of  $n$  elements

- Start with an empty heap
- Do  $n$  insertions into the heap

```
MinHeap H = new MinHeap();  
for(i=0 < i<A.size(); i++)  
    H.insert(A[i]);
```

Running time?  $O(n \lg n)$  – is this bound tight?

# 08-28: Building a Heap

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Total time:  $c_1 + \sum_{i=1}^n c_2 \lg i$

$$\begin{aligned} c_1 + \sum_{i=1}^n c_2 \lg i &\geq \sum_{i=n/2}^n c_2 \lg i \\ &\geq \sum_{i=n/2}^n c_2 \lg(n/2) \\ &= (n/2)c_2 \lg(n/2) \\ &= (n/2)c_2((\lg n) - 1) \\ &\in \Omega(n \lg n) \end{aligned}$$

Running Time:  $\Theta(n \lg n)$

# 08-29: Building a Heap

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Build a heap from the bottom up

- Place elements into a heap array
- Each leaf is a legal heap
- First potential problem is at location  $\lfloor i/2 \rfloor$

## 08-30: Building a Heap

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Build a heap from the bottom up

- Place elements into a heap array
- Each leaf is a legal heap
- First potential problem is at location  $\lfloor i/2 \rfloor$

```
for(i=n/2; i>=0; i--)  
    pushdown(i);
```



# 08-31: Building a Heap

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How many swaps, worst case? If every pushdown has to swap all the way to a leaf:

$n/4$  elements      1 swap

$n/8$  elements      2 swaps

$n/16$  elements    3 swaps

$n/32$  elements    4 swaps

...

Total # of swaps:

$$n/4 + 2n/8 + 3n/16 + 4n/32 + \dots + (\lg n)n/n$$

## 08-32: Decreasing a Key

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- Given a specific element in a heap, how can we decrease the key of that element, and maintain the heap property?
  - Examples

## 08-33: Decreasing a Key

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- Given a specific element in a heap, how can we decrease the key of that element, and maintain the heap property?
  - Examples
- Push the element up the tree, just like after an insert
  - Examples

## 08-34: Decreasing a Key

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- Decrease the key of a specific element in a heap:
  - Decrease the key value
  - Push the element up the tree, just like after an insert
- Time required?

## 08-35: Decreasing a Key

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- Decrease the key of a specific element in a heap:
  - Decrease the key value
  - Push the element up the tree, just like after an insert
- Time required:  $\Theta(\lg n)$ , in the worst case.

## 08-36: Removing an Element

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- Given a specific element in a heap, how can we remove that element, and maintain the heap property?
  - Examples

## 08-37: Removing an Element

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- Given a specific element in a heap, how can we remove that element, and maintain the heap property?
  - Examples
- Decrease key to a value  $<$  root
- Remove smallest element

## 08-38: Removing an Element

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- Given a specific element in a heap, how can we remove that element, and maintain the heap property?
  - Examples
- Decrease key to a value  $<$  root. Time  $\Theta(\lg n)$  worst case
- Remove smallest element. Time  $\Theta(\lg n)$  worst case



## 08-39: Java Specifics

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- When inserting an element, push value up until it reaches the root, or it's  $\geq$  its parent
  - Our while statement will have two tests
- We can insert a *sentinel* value at index 0, guaranteed to be  $\leq$  any element in the heap
  - Now our while loop only requires a single test