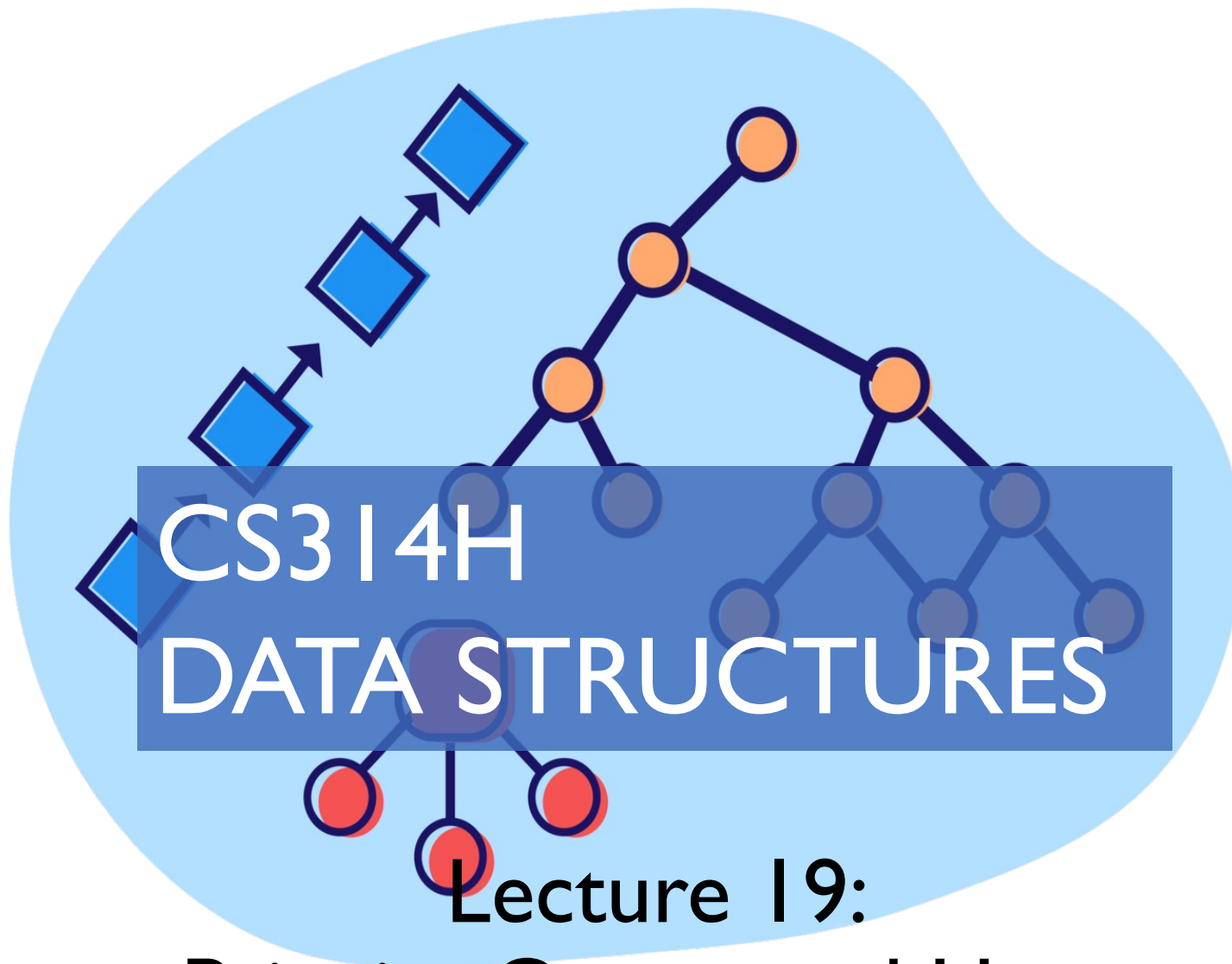




Priority Queue and Heap

Mikyung Han



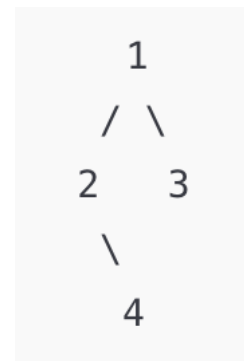
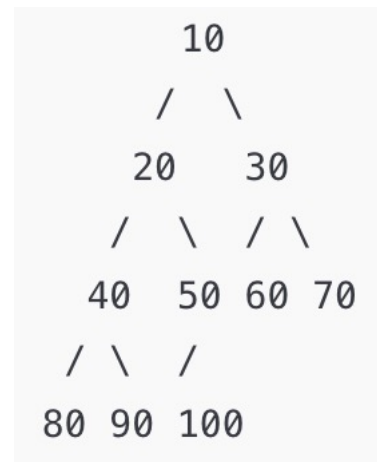
Please, interrupt and ask questions **AT ANY TIME !**

Outline

I. Binary Tree Analysis

Complete Binary Tree

- All the **levels** of the tree are filled completely except the lowest level
 - At the lowest level, nodes are filled from as left as possible
- Which is **NOT** a complete binary tree?



- Num nodes at level k?
- Min num nodes at the lowest level?

Complete Binary Tree

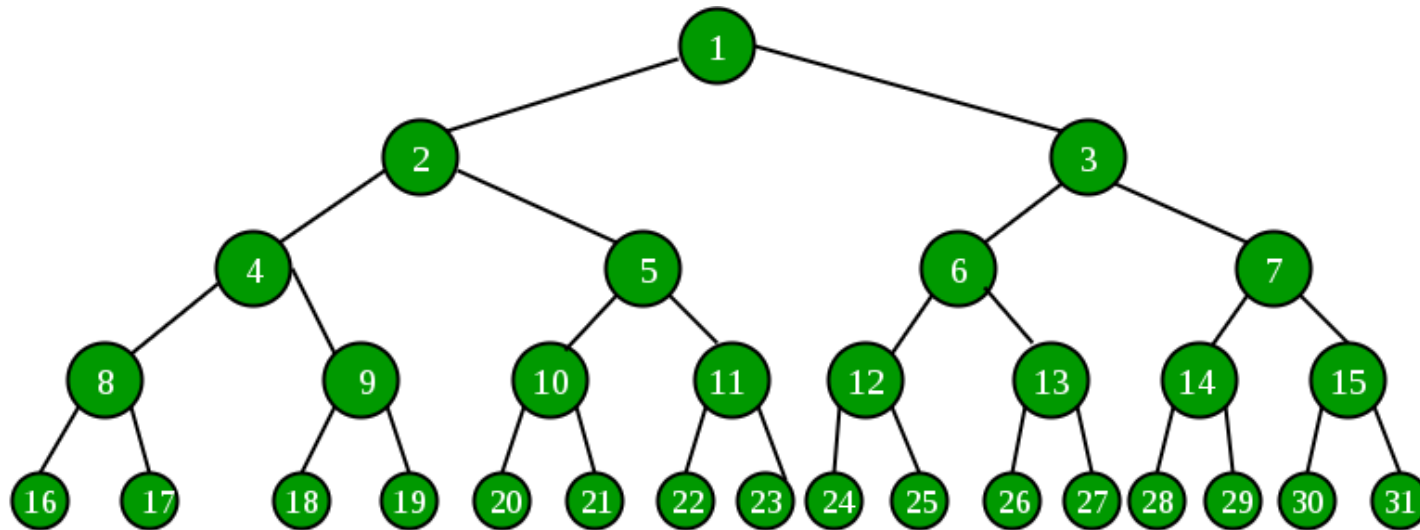
- All the **levels** of the tree are filled completely except the lowest level
 - At the lowest level, nodes are filled from as left as possible
- Num nodes at level k ?
- Min/max num nodes at the lowest level?

Complete Binary Tree

- All the **levels** of the tree are filled completely except the lowest level
 - At the lowest level, nodes are filled from as left as possible
- **Num nodes at level k?**
 - Root is at level 0
 - 2^k
- **Min/max num nodes at the lowest level?**
 - Let L be the number of levels
 - Min: 1
 - Max: 2^{L-1}

Perfect Binary Tree

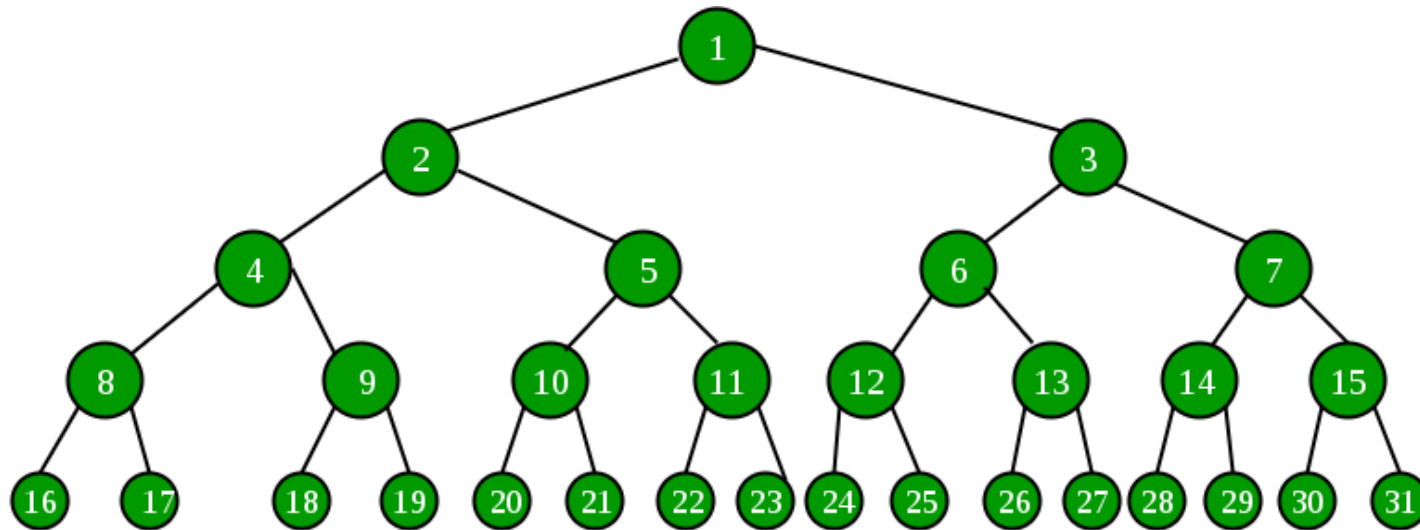
- All the **levels** of the tree are filled completely including the lowest level



- Total number of nodes given there are total L levels?
- How many leaf nodes?
- How many internal nodes?

Perfect Binary Tree

- All the **levels** of the tree are filled completely including the lowest level



Let L be the number of levels

- Total $2^L - 1$ nodes
- 2^{L-1} leaf nodes
- $2^{L-1} - 1$ internal nodes

Outline

I. Binary Tree Analysis

 2. Priority Queue

FIFO Queue ADT

Queue (FIFOQueue) ADT

<code>enqueue(val)</code>	Adds val to the queue.
<code>dequeue()</code>	Returns the least-recent item not already returned by a <code>dequeue</code> . (Errors if empty.)
<code>peek()</code>	Returns the least-recent item not already returned by a <code>dequeue</code> . (Errors if empty.)
<code>isEmpty()</code>	Returns true if all inserted elements have been returned by a <code>dequeue</code> .

- But sometimes we're interested in a **PriorityQueue** instead
 - A hospital ER room
 - OS process scheduling
 - Network packet routing
 - Discrete event simulation
 - etc

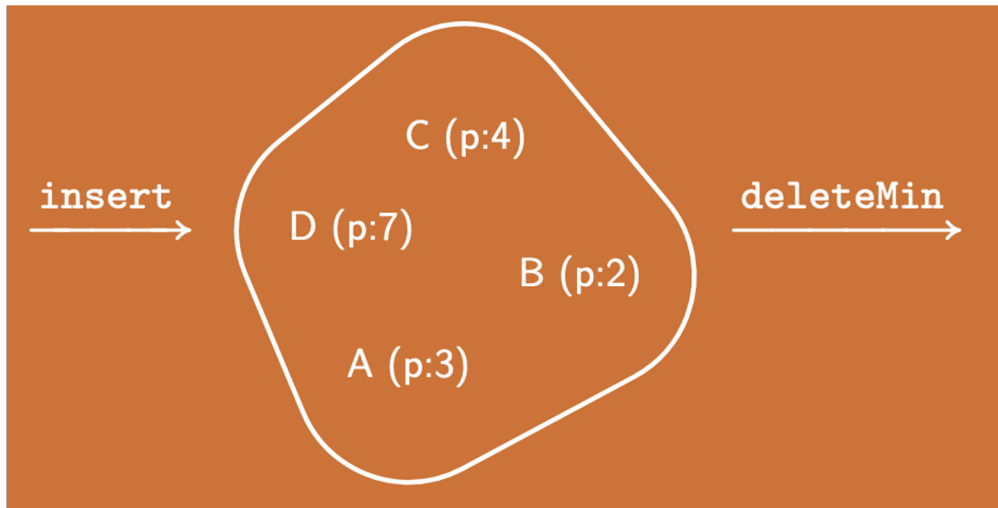
Priority Queue ADT

PriorityQueue ADT

<code>insert(val)</code>	Adds val to the queue.
<code>deleteMin()</code>	Returns the highest priority item not already returned by a <code>deleteMin</code> . (Errors if empty.)
<code>findMin()</code>	Returns the highest priority item not already returned by a <code>deleteMin</code> . (Errors if empty.)
<code>isEmpty()</code>	Returns true if all inserted elements have been returned by a <code>deleteMin</code> .

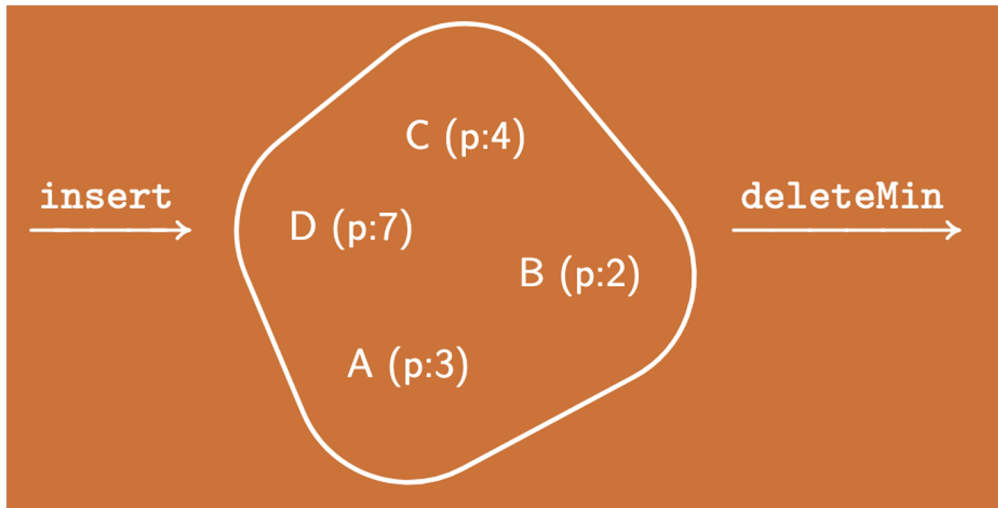
- Data in PriorityQueue must be **comparable**
- Highest priority == lowest priority value
- ADT does not specify tie case

Priority Queue Example



```
findMin  
deleteMin  
insert(E (p:1))  
deleteMin  
deleteMin
```

Priority Queue Example



```
findMin → B  
deleteMin → B  
insert(E (p:1))  
deleteMin → E  
deleteMin → A
```

Now let's talk about the **implementation**

Here are some options.

What is the cost of insert and deleteMin?

- Unsorted Array/Unsorted Linked List
- Sorted Circular Array List
- Sorted Linked List
- Binary Search Tree
- AVL?

Here are some options.

What is the cost of insert and deleteMin?

- **Unsorted Array**
 - Insert at the end $O(1)$ for Array, or at the front $O(1)$ for LinkedList
 - deleteMin: linear search $O(n)$ + shift $O(n)$ for Array. No shifting for LinkedList.
- **Sorted Circular Array List**
 - Insert by binary search and shift $O(n)$
 - deleteMin: move front no shifting needed $O(1)$
- **Sorted Linked List**
 - Insert by linear search $O(n)$
 - deleteMin: remove front and update front to front->next $O(1)$
- **Binary Search Tree**
 - Insert walk down to the leaf $O(n)$. Tree is not balanced
 - deleteMin: findMin and replace min with min's right child. $O(n)$. Tree not balanced
- **AVL**
 - Insert: Go to the correct leaf node to insert $O(\log n)$ and rebalance $O(1)$
 - deleteMin: Find left most node $O(\log n)$ delete and rebalance. $O(1)$

**Better data structure
needed!!**

Outline

1. Binary Tree Analysis

2. Priority Queue

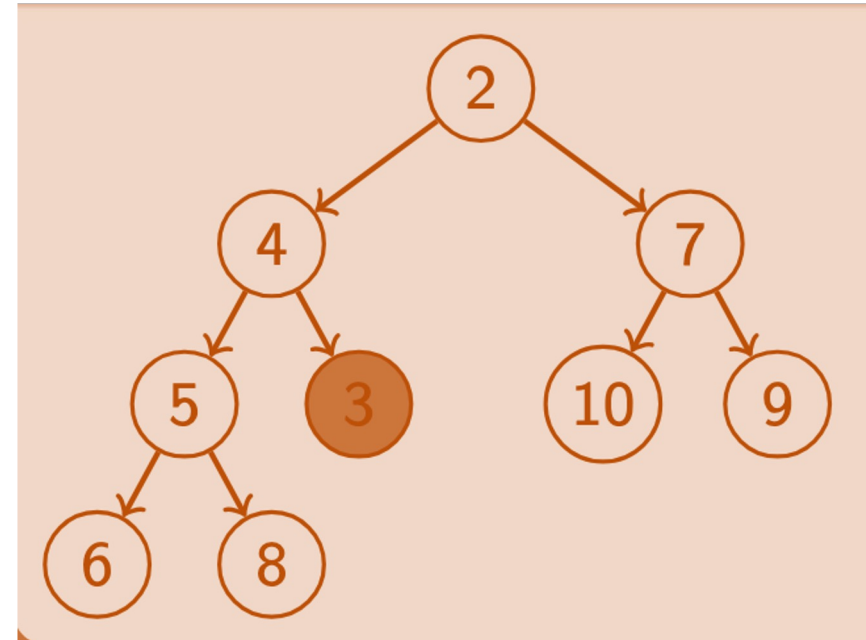
 3. Heap

Heap has two properties

Heap Property:
All Children are larger

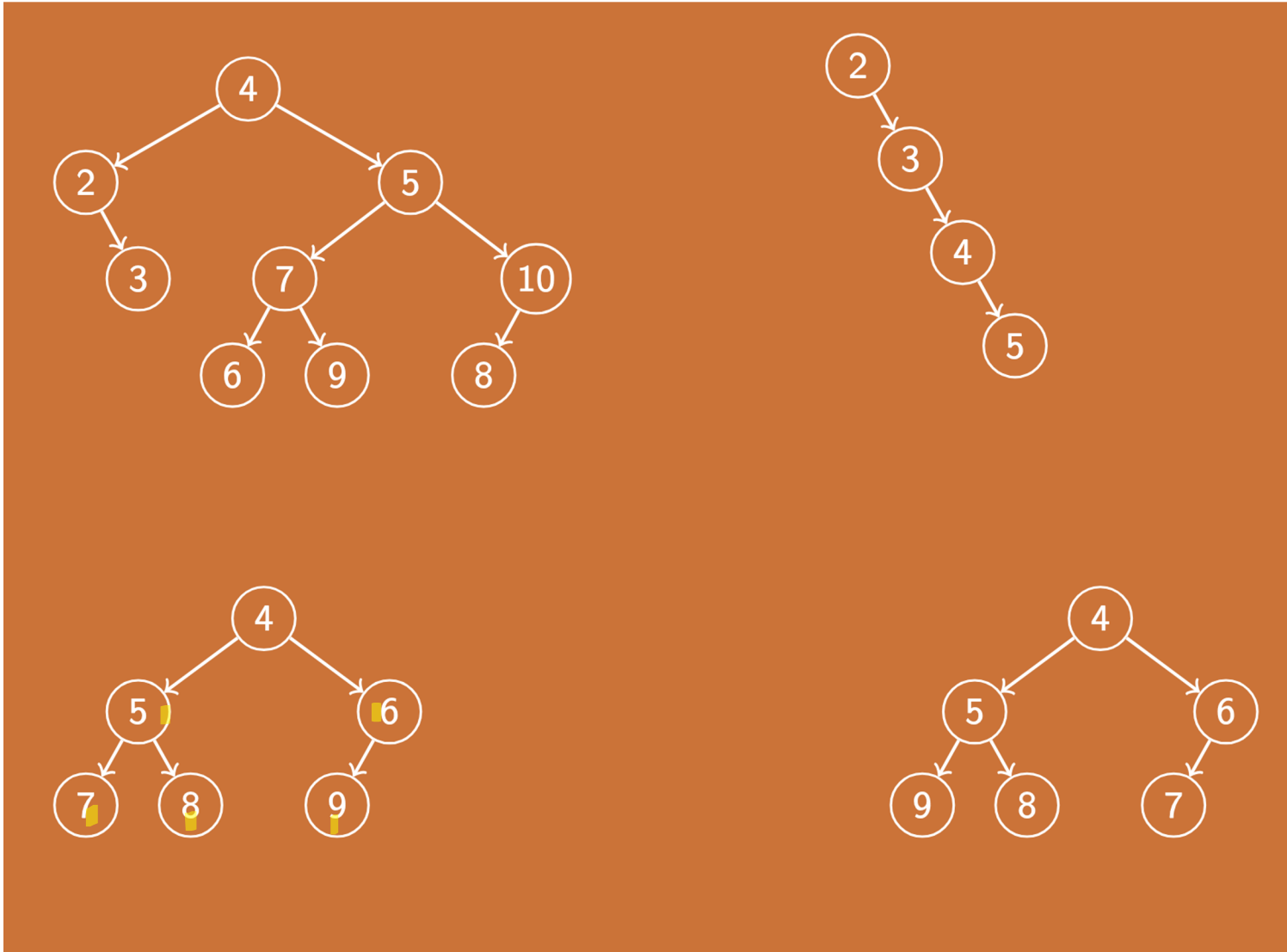
Structure Property:
Insist the tree has no “gaps”

- Where would be the min?



- Is this a heap?

Which ones are heap?



Heap properties

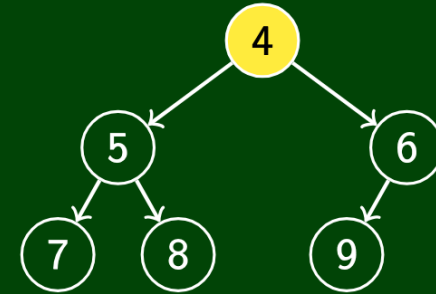
- Where is the minimum item in a heap?
 - At the root!
- What is the height h of a heap with n elements?
 - How many levels in this tree? $L = h + 1$
 - Total number of nodes $n \approx 2^{(h+1)} - 1$ (assuming perfect tree)
 - $h = O(\log_2 n)$
- FindMin is easy, how to insert, or deleteMin?

DeleteMin

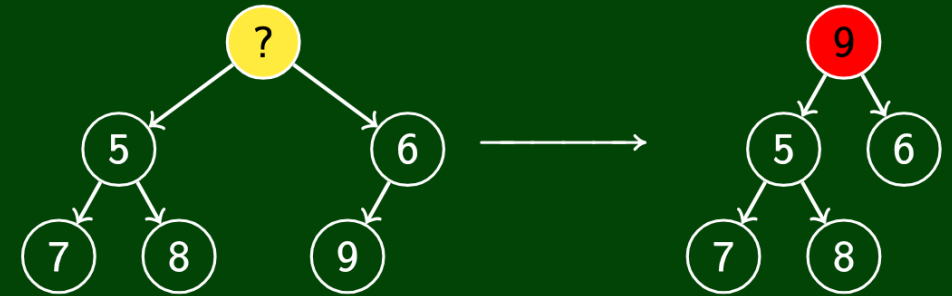
- Step 1: find the min
- Step 2: To preserve structure property who should fill the root?
 - Hint: we do not want to shift $O(n)$ times.
 - The last node is promoted as the root!
- Step 3: “Percolate down” to fix
 - To preserve heap property - all children is larger than itself
 - Pick one: Swap data with its [smaller or larger] child

DeleteMin Example

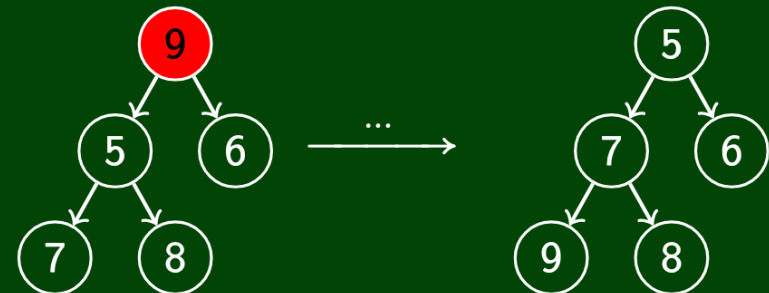
- Find the min:



- Remove the min and fill the hole with the last child

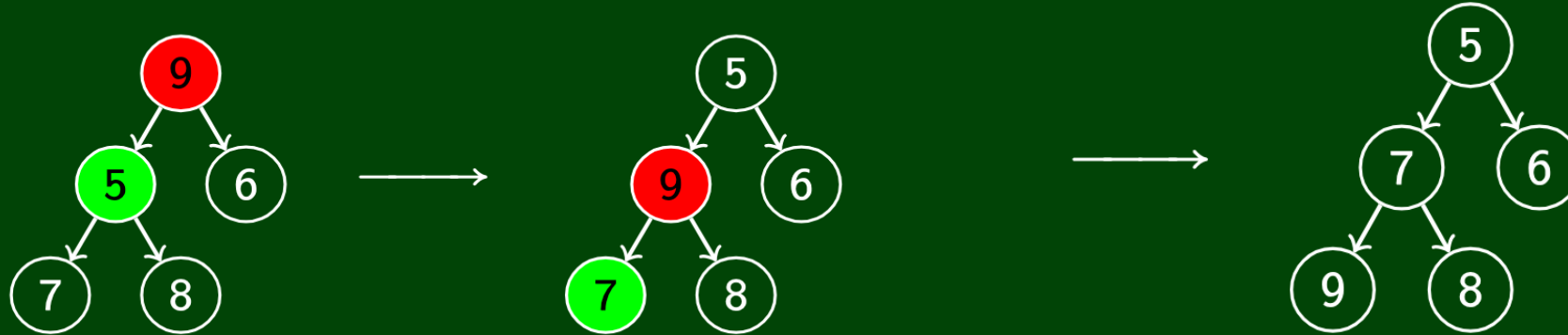


- “Percolate Down” to fix the invariant:

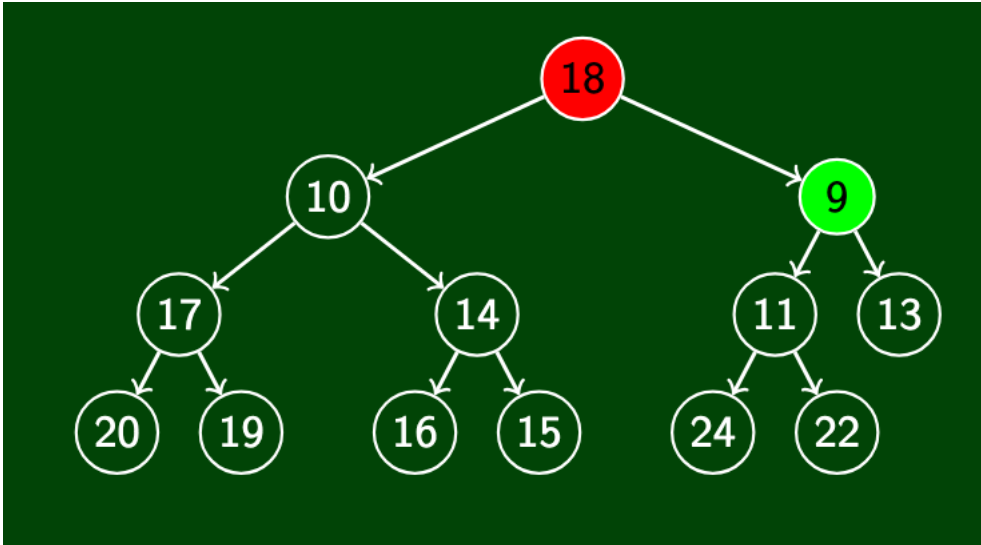


“Percolate down”

```
1 percolateDown(node) {  
2     while (node.data is greater than either child) {  
3         swap data with smaller child  
4     }  
5 }
```



“Percolate down” another example



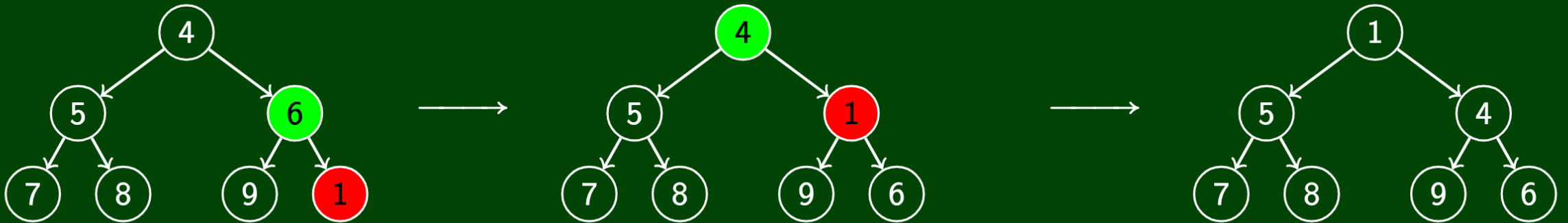
What is the time complexity of percolate down?

Insert

- **Step 1: To preserve structure property where to insert?**
 - Hint: we do not want to shift $O(n)$ times.
 - The the very end!
- **Step 2: "Percolate up" to fix**
 - If my data is smaller than the parent's, swap data!

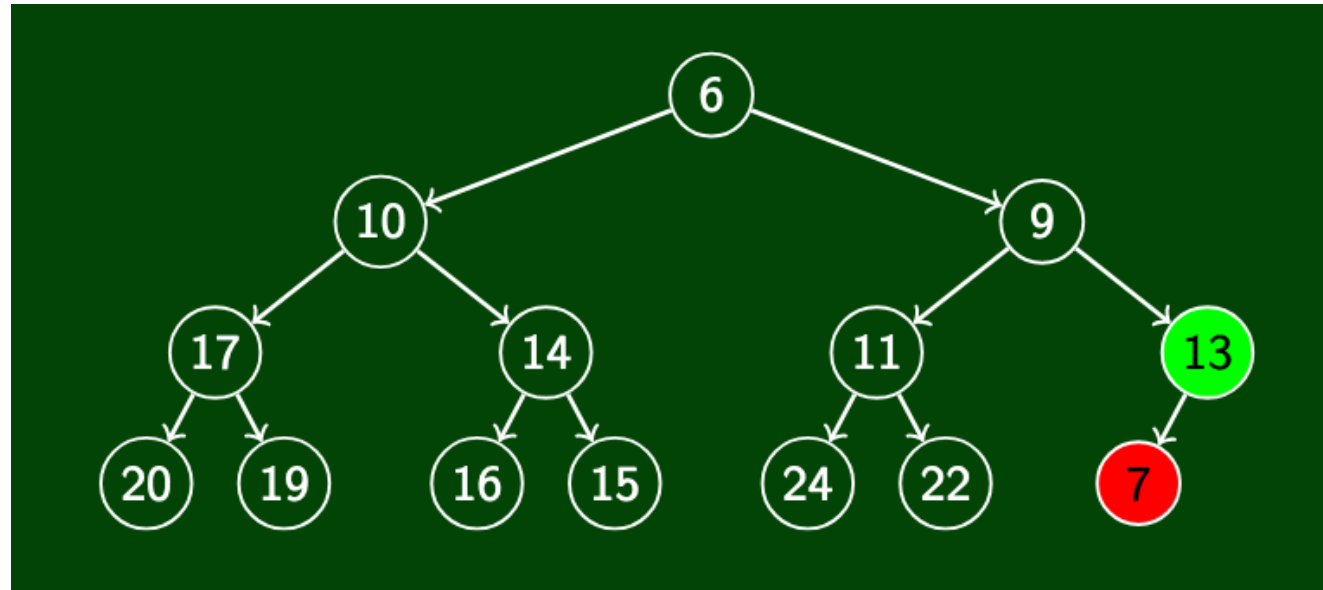
“Percolate Up”

```
1 percolateUp(node) {  
2   while (node.data is smaller than parent) {  
3     swap data with parent  
4   }  
5 }
```



What is the time complexity of percolate up?

Percolate up another example



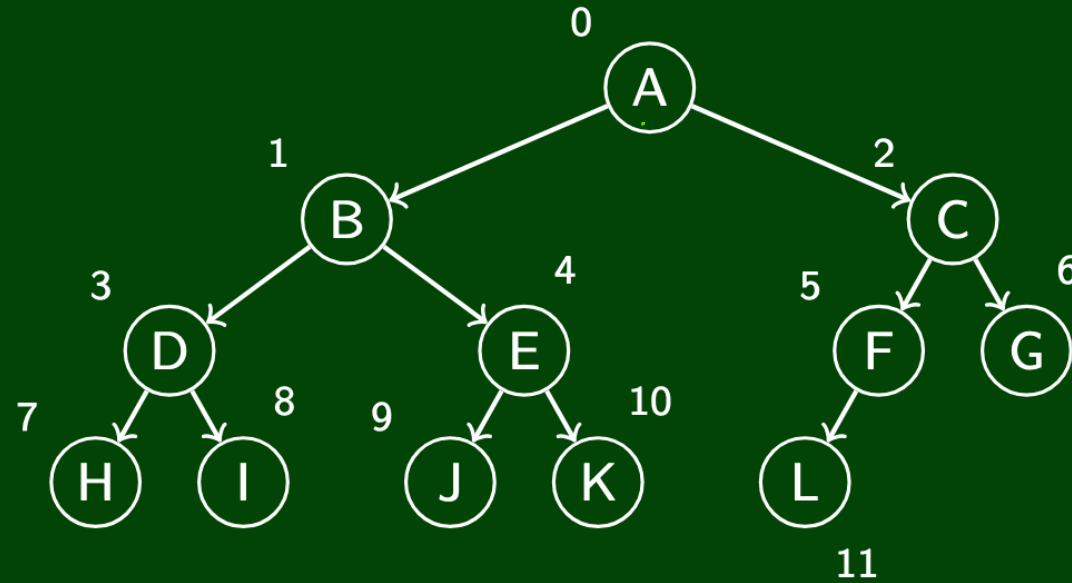
How to implement Heap?

Which option would you choose?

- Option 1: Use TreeNode with left/right references
- Option 2: Use array representation

Use array! Fill in array by level-order

Heap array



Fill in an array in **level-order** of the tree:

heap:

A	B	C	D	E	F	G	H	I	J	K	L	0	0	0
h[0]	h[1]	h[2]	h[3]	h[4]	h[5]	h[6]	h[7]	h[8]	h[9]	h[10]	h[11]	h[12]	h[13]	h[14]

Outline

1. Binary Tree Analysis
2. Priority Queue
-  3. Heap analysis

Recap

- **Heap property**
 - Relationship between root and its children
 - Relationship between siblings
- **Structure property**
 - Complete binary tree
- **Insert**
 - Where do you insert to satisfy the structure property?
 - Percolate up or down to satisfy the heap property?

Average Case Analysis: Insert to a heap with n nodes

- **How many nodes ...**
 - in the last level?
 - 2nd to the last level?
 - 3rd to the last level?
- **What are the chances that the node just inserted eventually land ...**
 - On the last level?
 - 2nd to the last level?
 - 3rd to the last level?
 - What is the number of comparisons for each case?
- **For average case, we pick a random value x**
 - $\frac{1}{2}$ probability that we compare once
 - $\frac{1}{4}$ probability that we compare twice

Average Case Analysis: Insert to a heap with n nodes

- For average case, we pick a random value x to insert
 - 1/2 probability that we compare once
 - 1/4 probability that we compare twice
 - 1/8 probability that we compare 3 times
 - Etc.
- Sum
 - $1/2 + 2/4 + 3/8 + 4/16 + 5/32 \dots = \sum_{k=1}^{\infty} \frac{k}{2^k}$

Will this converge?

Average Case Analysis: Insert to a heap with n nodes

- Let $Z = \sum_{k=1}^{\infty} \frac{k}{2^k} = 1/2 + 2/4 + 3/8 + 4/16 + 5/32 \dots$
- Div Z by 2: $Z/2 = 1/4 + 2/8 + 3/16 + 4/32 + 5/64 \dots$
- $Z - Z/2 = S$
- $S = 1/2 + 1/4 + 1/8 + 1/16 + 1/32 \dots$
- $S - S/2 = 1/2$
- $S = 1$
- $Z = 2$

Constant time! What does this mean?

Outline

1. Administrative
2. Heap analysis
-  3. Other possible operations of Heap

More operations to support besides insert, findMin, deleteMin

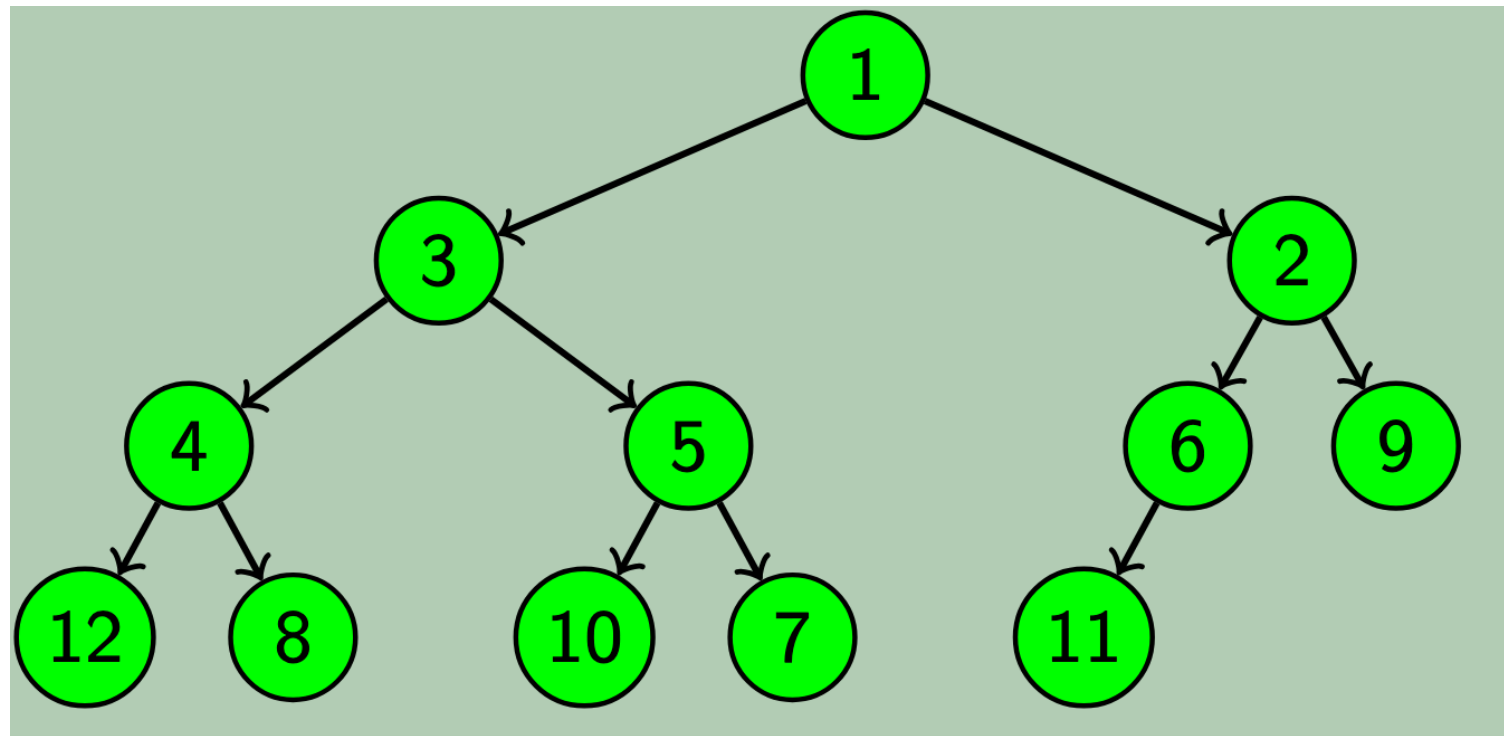
Given a particular index i of the array

- **increasePriority(i , newPriority)**
 - i has now higher priority
- **decreasePriority(i , newPriority)**
 - i has low lower priority
- **buildHeap(array)**
 - Where array is unsorted elements

How would you implement them? Time complexity?

Increase/Decrease Priority Example

- Increase priority: Change 6 to 0
- Decrease priority: Change 1 to 15



Outline

1. Administrative
2. Heap analysis
3. Other possible operations of Heap
-  4. **Building heap**

Building heap: Simply use insert

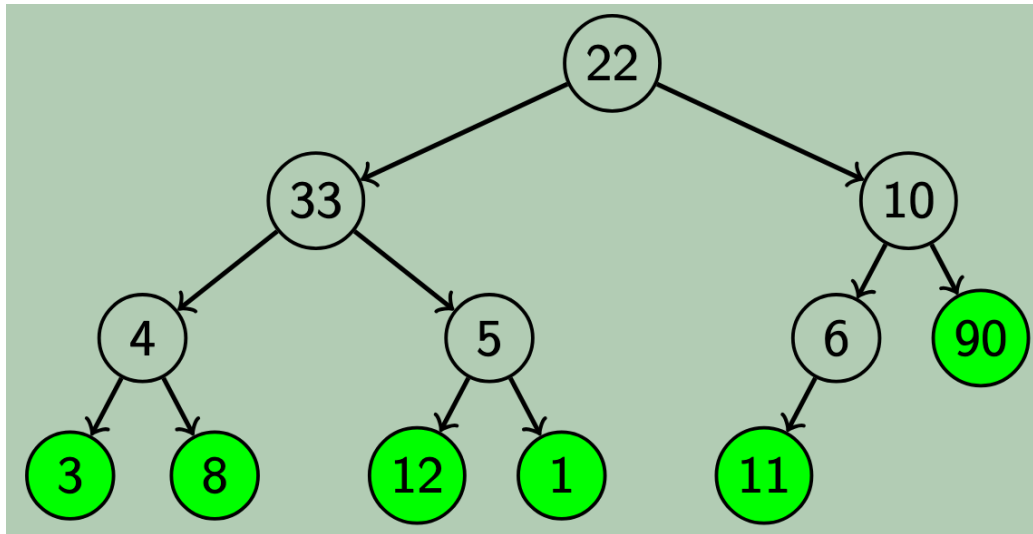
The Easy Way...

```
1 void buildHeap(int[] input) {  
2     for (int i = 0; i < input.length; i++) {  
3         insert(input[i]);  
4     }  
5 }
```

What is the time complexity?

Floyd's algorithm

- Rather than insert and fix the heap one by one
- Insert all and fix all at once
 - input array itself is a heap to be fixed
- Example
 - input array = [22, 33, 10, 4, 5, 6, 90, 3, 8, 12, 1, 11]
 - Note leaf nodes are already valid heap!



How to fix?

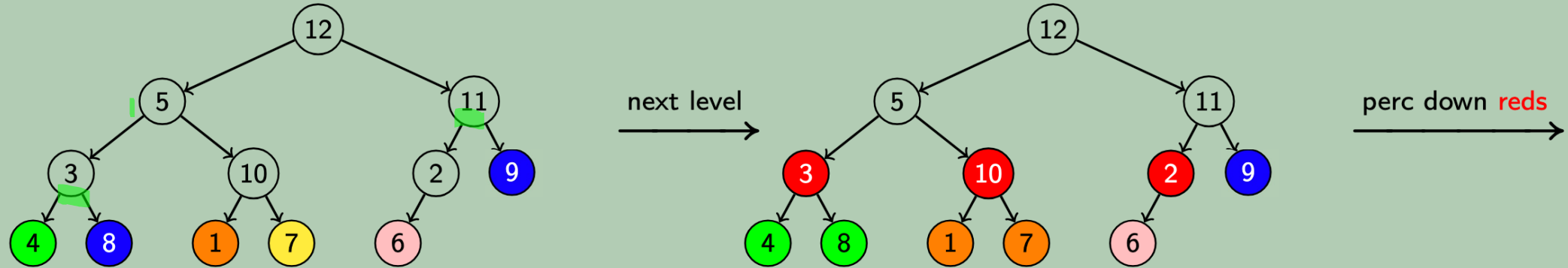
Floyd's algorithm

- **Insert all and fix all at once**
 - input array itself is a heap to be fixed
 - Starting with a largest index node with children, percolate down!

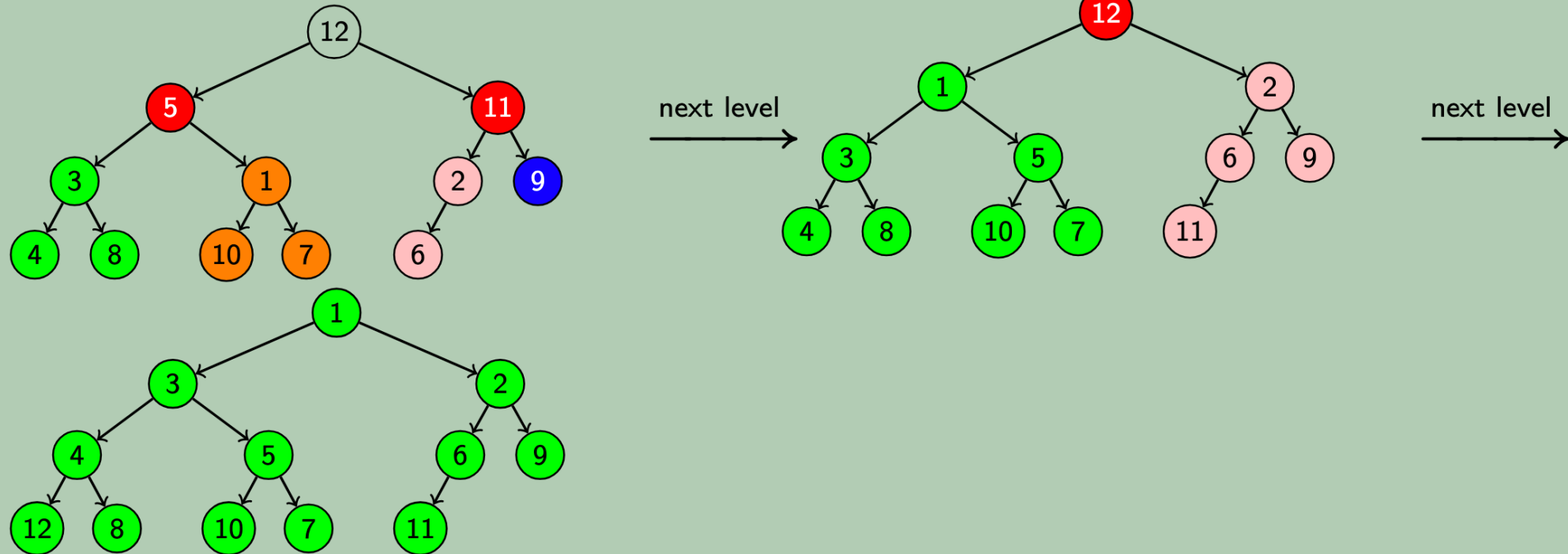
```
1 void buildHeap(int[] input) {  
2     for (i = size / 2 - 1; i >= 0; i--) {  
3         percolateDown(i);  
4     }  
5 }
```

Floyd's buildHeap

Each highlighted node is a valid heap! Percolate down red nodes until at top



Each color represents a valid heap



Time Complexity of Floyd's algorithm

- Is Floyd's algorithm better?

```
1 void buildHeap(int[] input) {  
2     for (i=size/2 - 1; i>=0; i--) {  
3         percolateDown(i);  
4     }  
5 }
```

```
1 void buildHeap(int[] input) {  
2     for (int i = 0; i < input.length; i++) {  
3         insert(input[i]);  
4     }  
5 }
```

A tighter worst-case analysis of Floyd's algorithm

- How many nodes on the lowest level?
 - $n/2$
- How many nodes on the 2nd lowest level?
 - $n/4$
- How many nodes in the 3rd lowest level?
 - $n/8$
- How many nodes in the 4th lowest level?
 - $n/16$
- Etc...

A tighter worst-case analysis of Floyd's algorithm

- Max num percolation for nodes on the lowest level?
 - 0
- Max num percolation for nodes on the 2nd lowest level?
 - 1
- Max num percolation for nodes on the 3rd lowest level?
 - 2
- Max num percolation for nodes on the 4th lowest level?
 - 3
- Etc..

Putting it together..

A tighter worst-case analysis of Floyd's algorithm

- $1 \times n/4 + 2 \times n/8 + 3 \times n/16 + \dots = nS$
- $S - S/2$
 - Do coloring or telescoping to solve S
- $S = 1$

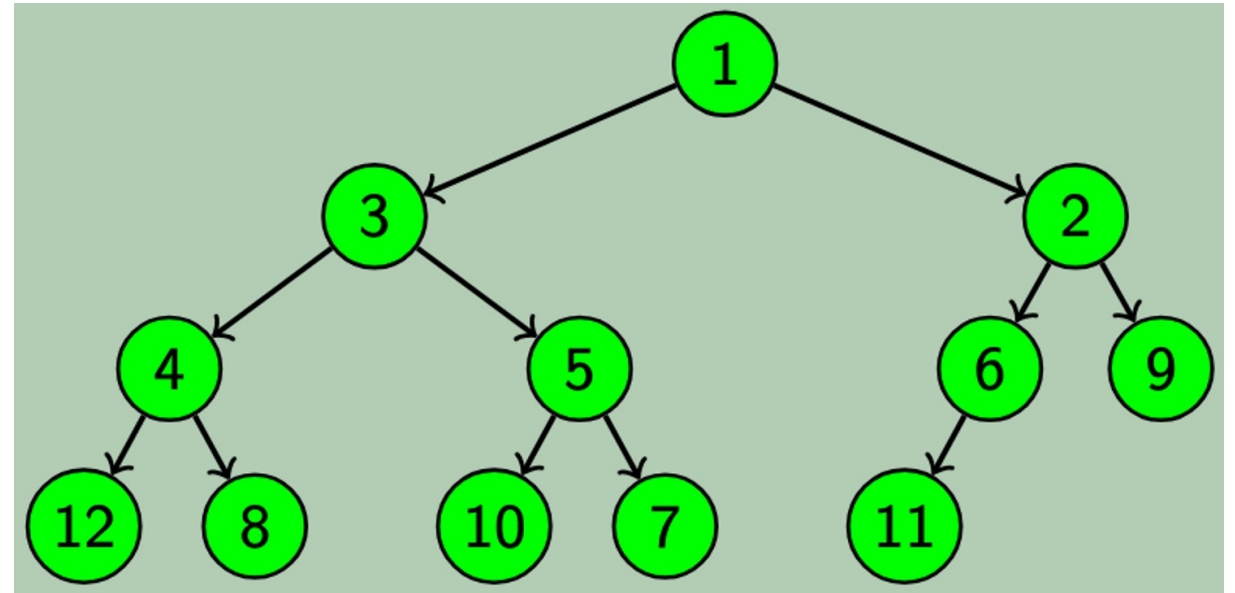
Floyd's Algorithm is $O(n)$ in the WORST case,
which is better than inserting one by one n times

Outline

1. Administrative
2. Heap analysis
3. Other possible operations of Heap
4. Building heap
-  5. **Heapsort**

How to use heap to do sorting?

- Treat input array as a complete binary tree
- Heapify using Floyd's algorithm
- Call DeleteMin n times!
 - Instead of actually removing, keep the item on the back of the unsorted array



- Use Max heap sort ascending order