

# Binary Heaps

COL 106

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# Revisiting FindMin

- Application: Find the smallest ( or highest priority) item quickly
  - **Operating system** needs to schedule jobs according to priority instead of FIFO
  - **Event simulation** (bank customers arriving and departing, ordered according to when the event happened)
  - **Find** student with highest grade, employee with highest salary etc.

# Priority Queue ADT

- Priority Queue can efficiently do:
  - FindMin (and DeleteMin)
  - Insert
- What if we use...
  - **Lists**: If sorted, what is the run time for Insert and FindMin? Unsorted?
  - **Binary Search Trees**: What is the run time for Insert and FindMin?
  - **Hash Tables**: What is the run time for Insert and FindMin?

# Less flexibility → More speed

- Lists
  - If sorted: FindMin is  $O(1)$  but Insert is  $O(N)$
  - If not sorted: Insert is  $O(1)$  but FindMin is  $O(N)$
- Balanced Binary Search Trees (BSTs)
  - Insert is  $O(\log N)$  and FindMin is  $O(\log N)$
- Hash Tables
  - Insert  $O(1)$  but no hope for FindMin
- BSTs look good but...
  - BSTs are efficient for all Finds, not just FindMin
  - We only need FindMin

# Better than a speeding BST

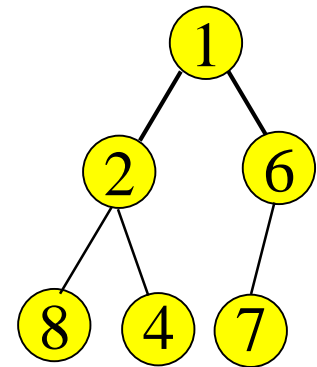
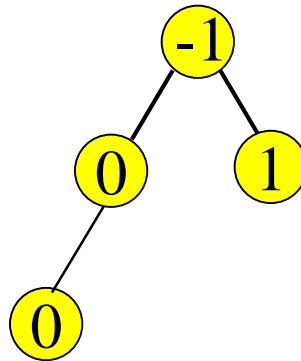
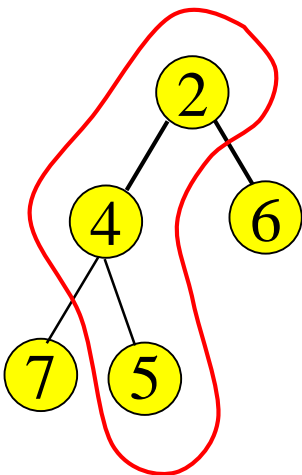
- We can do better than Balanced Binary Search Trees?
  - Very limited requirements: Insert, FindMin, DeleteMin. The goals are:
    - FindMin is  $O(1)$
    - Insert is  $O(\log N)$
    - DeleteMin is  $O(\log N)$

# Binary Heaps

- A binary heap is a binary tree (NOT a BST) that is:
  - **Complete**: the tree is completely filled except possibly the bottom level, which is filled from left to right
  - **Satisfies the heap order property**
    - every node is less than or equal to its children
    - or every node is greater than or equal to its children
- **The root node is always the smallest node**
  - or the largest, depending on the heap order

# Heap order property

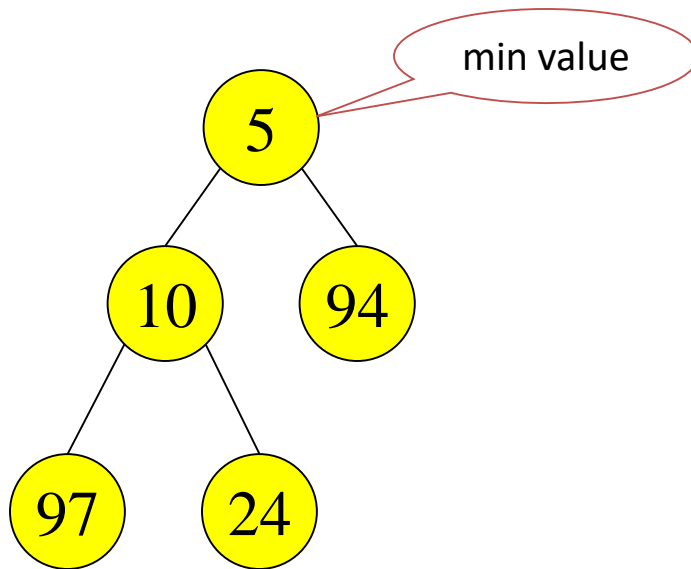
- A heap provides limited ordering information
- Each *path* is sorted, but the subtrees are not sorted relative to each other
  - A binary heap is NOT a binary search tree



These are all valid binary heaps (minimum)

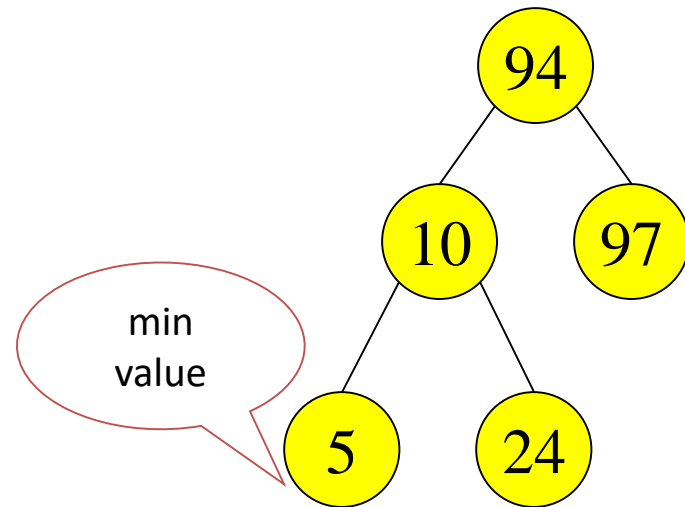
# Binary Heap vs Binary Search Tree

Binary Heap



Parent is less than both left and right children

Binary Search Tree

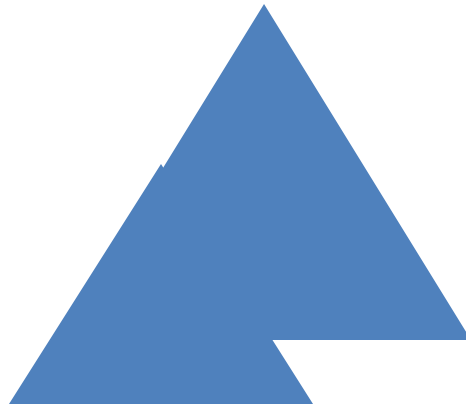


Parent is greater than left child, less than right child

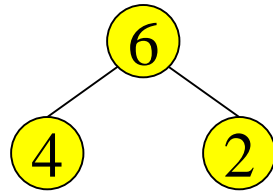


# Structure property

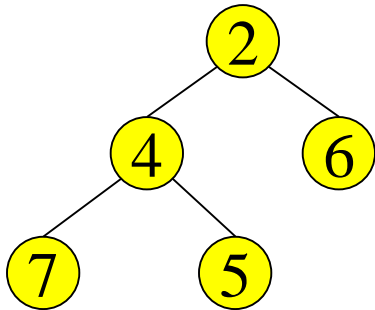
- A binary heap is a complete tree
  - All nodes are in use except for possibly the right end of the bottom row



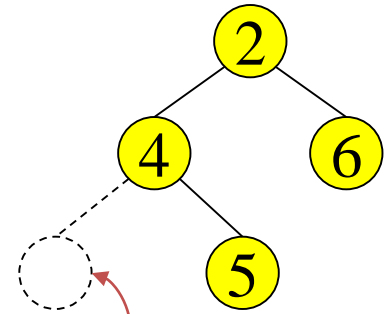
# Examples



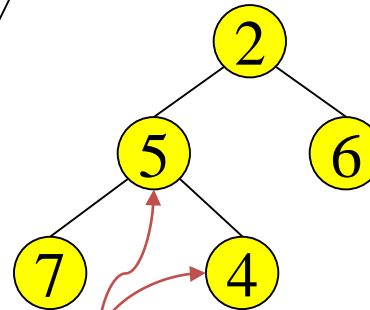
complete tree,  
heap order is "max"



complete tree,  
heap order is "min"



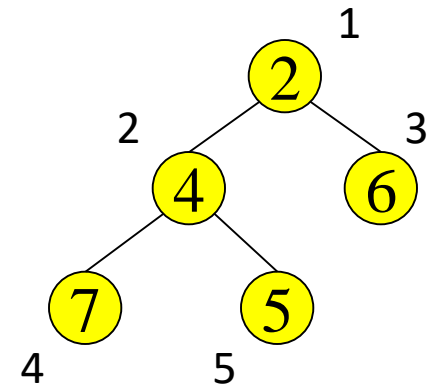
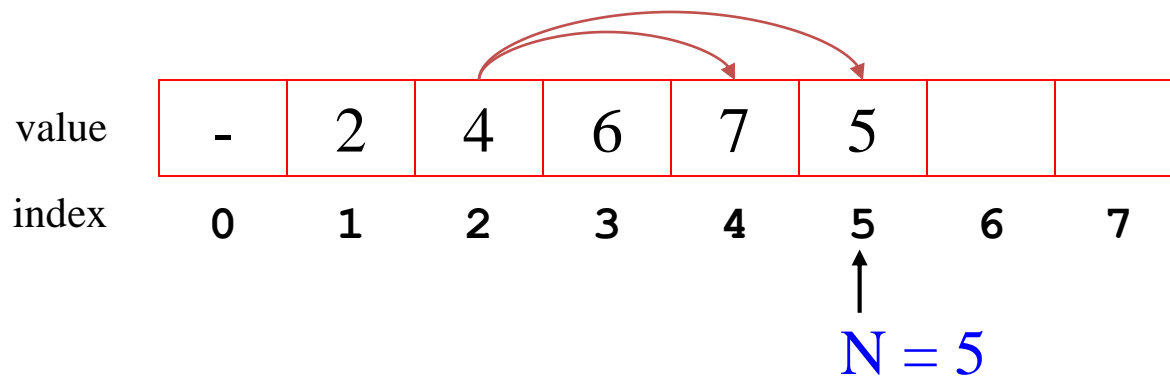
not complete



complete tree, but min  
heap order is broken

# Array Implementation of Heaps (Implicit Pointers)

- Root node =  $A[1]$
- Children of  $A[i] = A[2i], A[2i + 1]$
- Parent of  $A[j] = A[j/2]$
- Keep track of current size  $N$  (number of nodes)

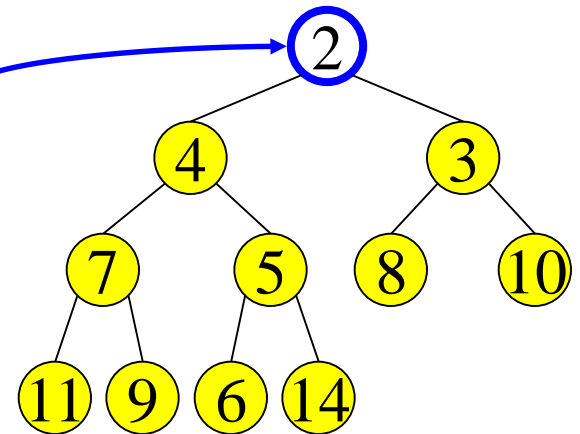


# FindMin and DeleteMin

- FindMin: Easy!

- Return root value  $A[1]$

- Run time = ?

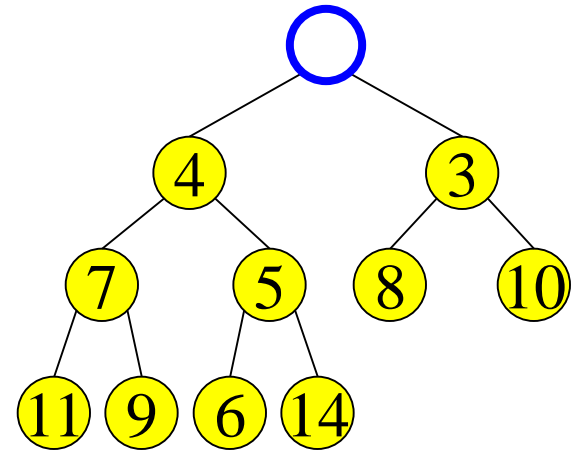


- DeleteMin:

- Delete (and return) value at root node

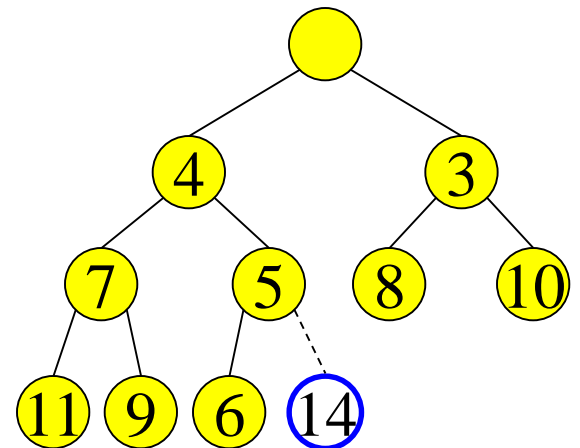
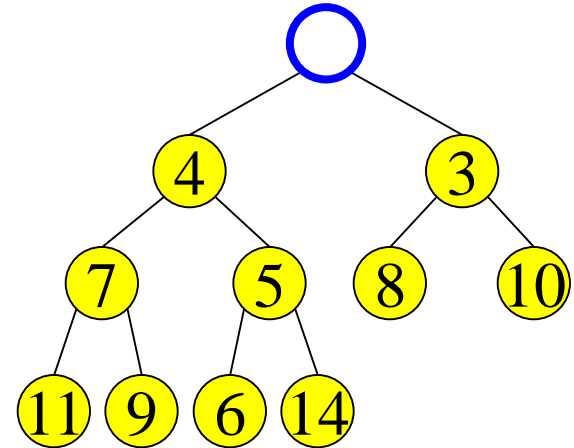
# DeleteMin

- Delete (and return) value at root node



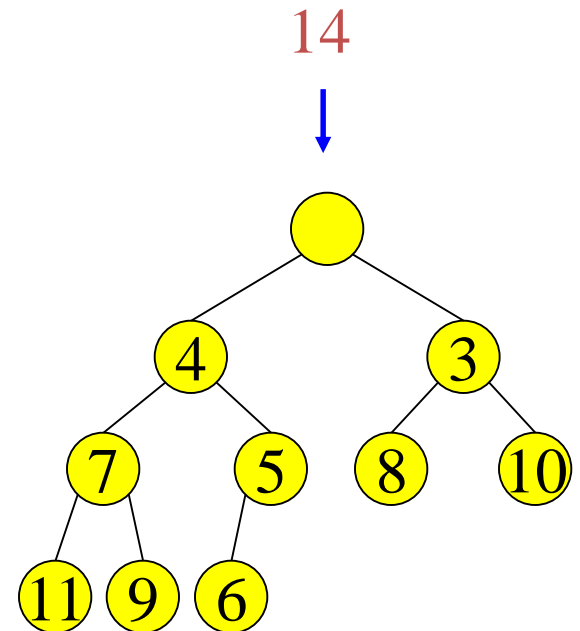
# Maintain the Structure Property

- We now have a “Hole” at the root
  - Need to fill the hole with another value
- When we get done, the tree will have one less node and must still be complete

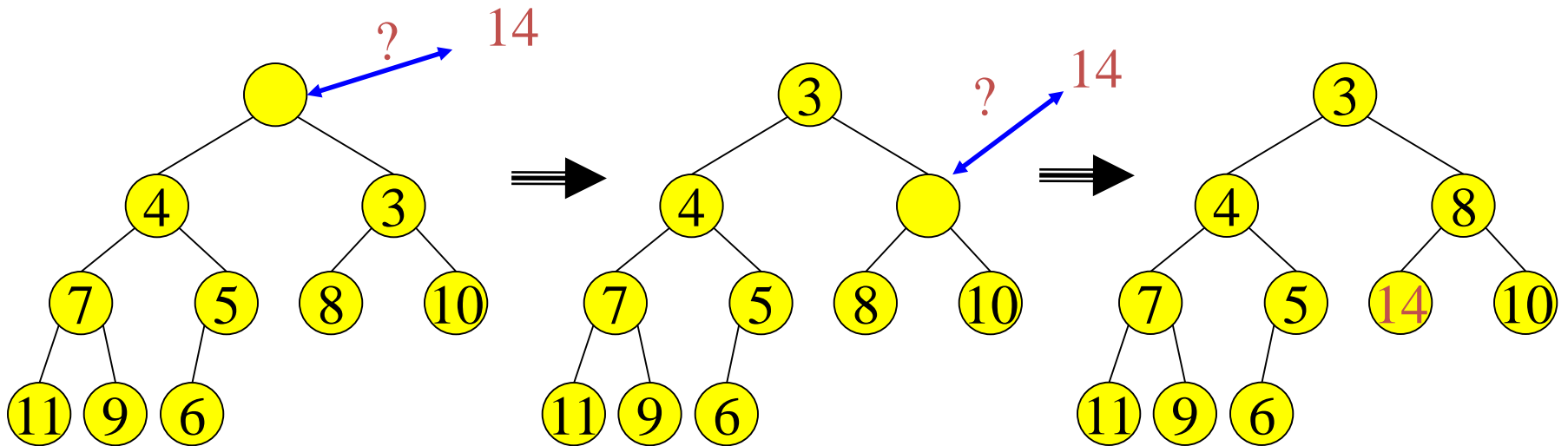


# Maintain the Heap Property

- The last value has lost its node
  - we need to find a new place for it



# DeleteMin: Percolate Down



- Keep comparing with children  $A[2i]$  and  $A[2i + 1]$
- Copy smaller child up and go down one level
- Done if both children are  $\geq$  item or reached a leaf node
- What is the run time?



1 2 3 4 5 6

~~6~~ | 10 | 8 | 13 | 14 | 25

# Percolate Down

```
PercDown(i:integer, x: integer): {  
  // N is the number elements, i is the hole,  
  x is the value to insert
```

```
Case{
```

no children  
one child  
at the end

```
  2i > N : A[i] := x; //at bottom//  
  2i = N : if A[2i] < x then  
            A[i] := A[2i]; A[2i] := x;  
            else A[i] := x;  
  2i < N : if A[2i] < A[2i+1] then j := 2i;  
            else j := 2i+1;  
            if A[j] < x then  
              A[i] := A[j]; PercDown(j, x);  
            else A[i] := x;
```

2 children

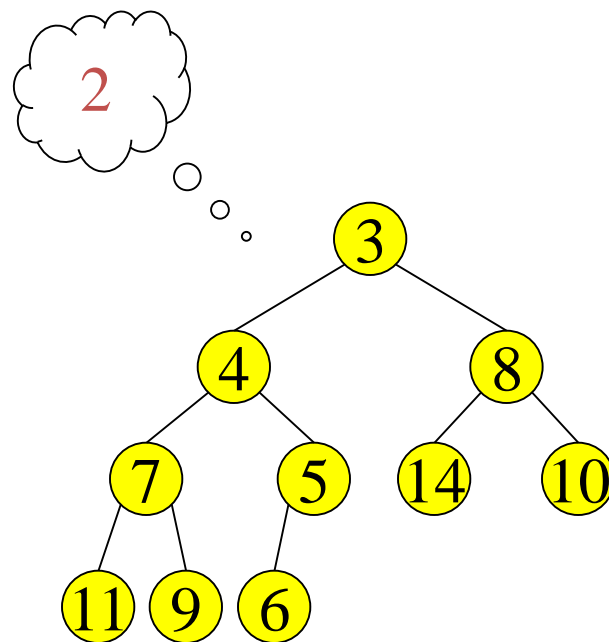
```
}}
```

# DeleteMin: Run Time Analysis

- Run time is  $O(\text{depth of heap})$
- A heap is a complete binary tree
- Depth of a complete binary tree of  $N$  nodes?
  - $\text{depth} = \log_2(N)$
- Run time of DeleteMin is  $O(\log N)$

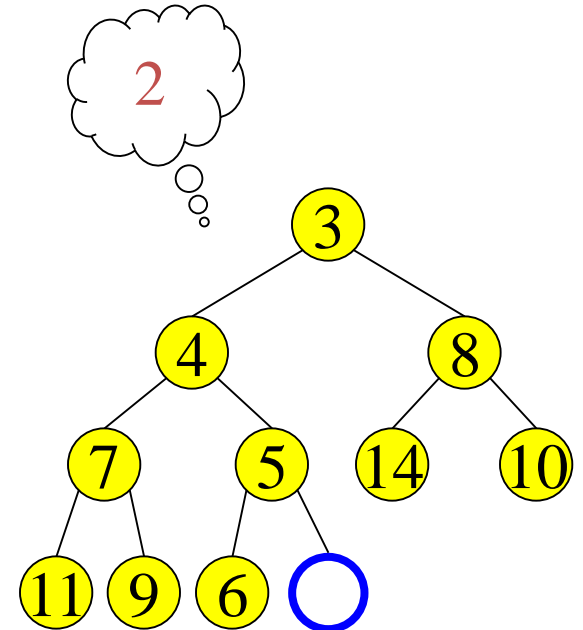
# Insert

- Add a value to the tree
- Structure and heap order properties must still be correct when we are done



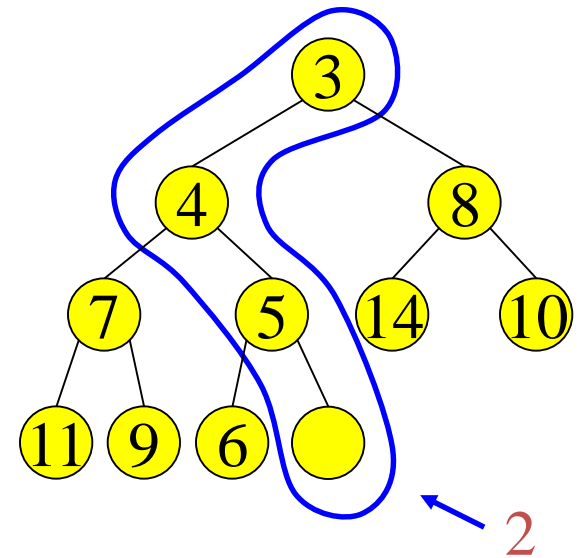
# Maintain the Structure Property

- The only valid place for a new node in a complete tree is at the end of the array
- We need to decide on the correct value for the new node, and adjust the heap accordingly

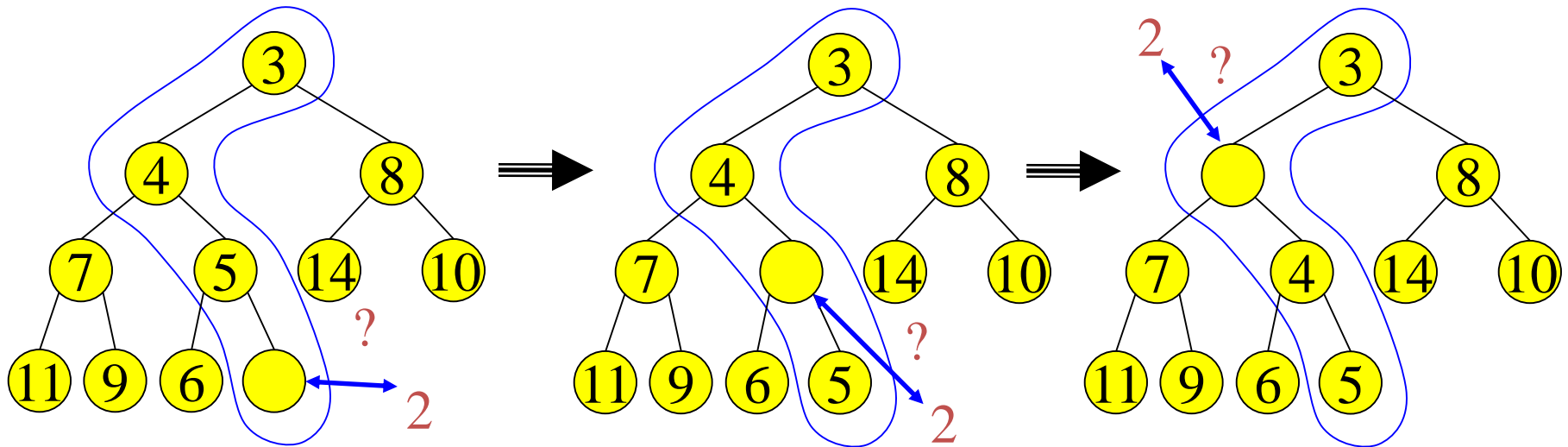


# Maintain the Heap Property

- The new value goes where?

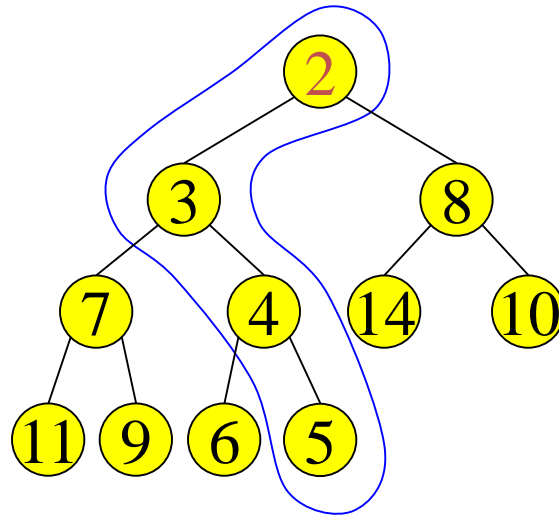


# Insert: Percolate Up



- Start at last node and keep comparing with parent  $A[i/2]$
- If parent larger, copy parent down and go up one level
- Done if parent  $\leq$  item or reached top node  $A[1]$

# Insert: Done



- Run time?

# Binary Heap Analysis

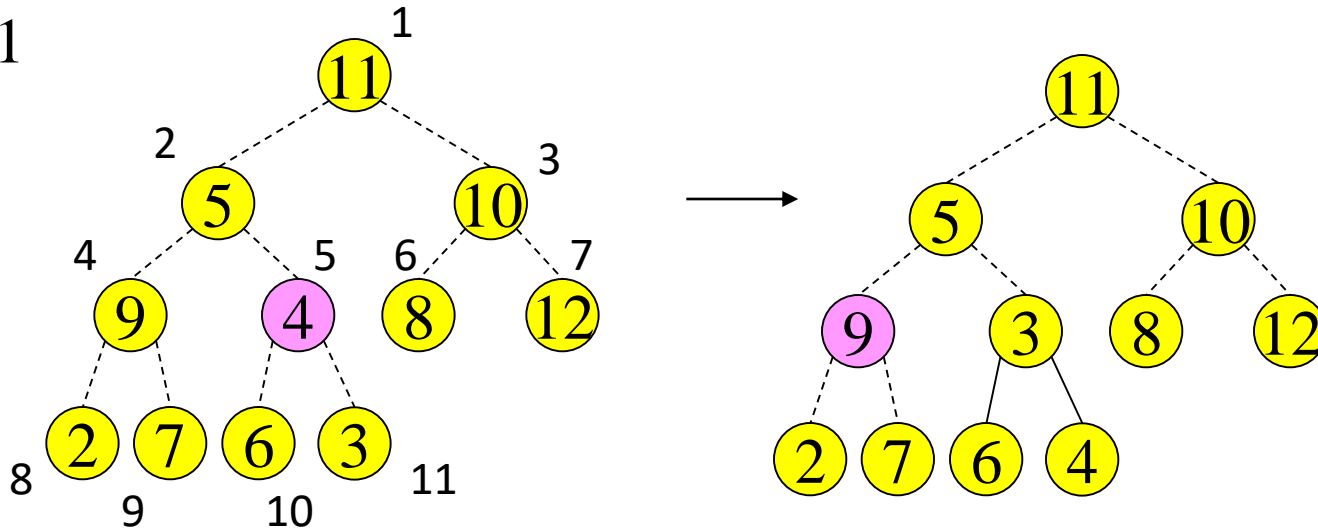
- Space needed for heap of  $N$  nodes:  $O(\text{MaxN})$ 
  - An array of size  $\text{MaxN}$ , plus a variable to store the size  $N$
- Time
  - FindMin:  $O(1)$
  - DeleteMin and Insert:  $O(\log N)$
  - BuildHeap from  $N$  inputs ???



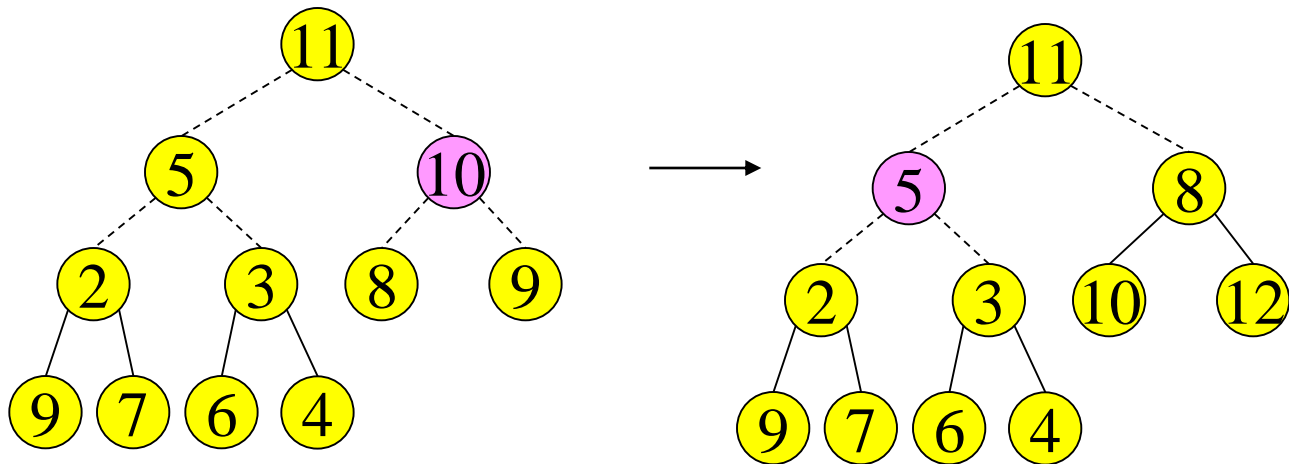
# Build Heap

```
BuildHeap {  
  for i = N/2 to 1  
    PercDown(i, A[i])  
}
```

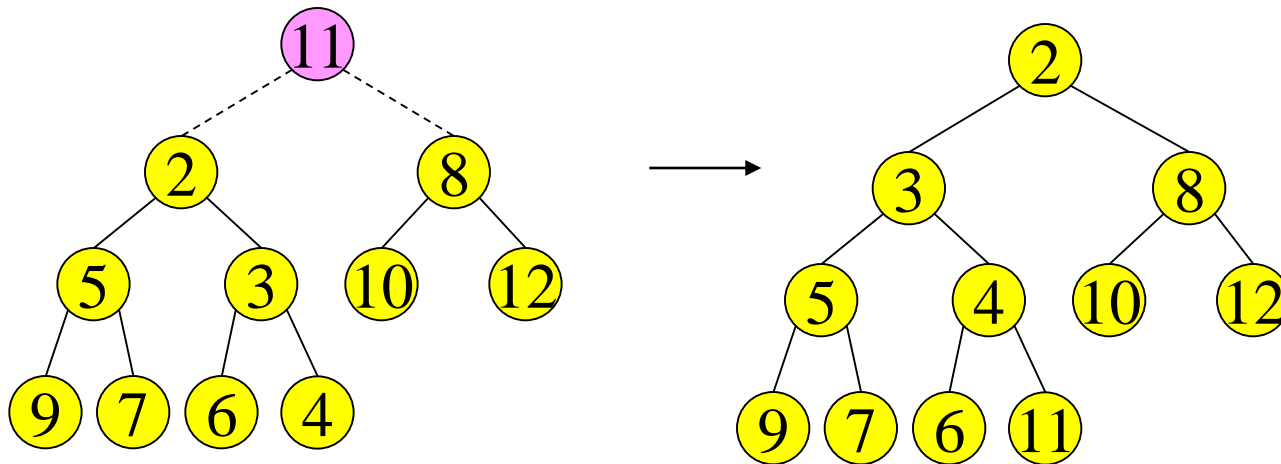
N=11



# Build Heap



# Build Heap



# Time Complexity

- Naïve considerations:
  - $n/2$  calls to `PercDown`, each takes  $c \log(n)$
  - Total:  $cn \log(n)$
- More careful considerations:
  - Only  $O(n)$

# Analysis of Build Heap

Assume  $n = 2^{h+1} - 1$  where  $h$  is height of the tree

- Thus, level  $h$  has  $2^h$  nodes but there is nothing to PercDown
- At level  $h-1$  there are  $2^{h-1}$  nodes, each might percolate down 1 level
- At level  $h-j$ , there are  $2^{h-j}$  nodes, each might percolate down  $j$  levels

Total Time

$$\begin{aligned} T(n) &= \sum_{j=0}^h j 2^{h-j} = \sum_{j=0}^h j \frac{2^h}{2^j} \\ &= O(n) \end{aligned}$$

# Other Heap Operations

- **Find(X, H)**: Find the element X in heap H of N elements
  - What is the running time?  $O(N)$
- **FindMax(H)**: Find the maximum element in H
- Where FindMin is  $O(1)$ 
  - What is the running time?  $O(N)$
- **We sacrificed performance of these operations in order to get  $O(1)$  performance for FindMin**

# Other Heap Operations

- `DecreaseKey(P, Δ, H)`: Decrease the key value of node at position  $P$  by a positive amount  $\Delta$ , e.g., to increase priority
  - First, subtract  $\Delta$  from current value at  $P$
  - Heap order property may be violated
  - so percolate up to fix
  - Running Time:  $O(\log N)$

# Other Heap Operations

- IncreaseKey( $P, \Delta, H$ ): Increase the key value of node at position  $P$  by a positive amount  $\Delta$ , e.g., to decrease priority
  - First, add  $\Delta$  to current value at  $P$
  - Heap order property may be violated
  - so percolate down to fix
  - Running Time:  $O(\log N)$



# Other Heap Operations

- Delete(P,H): E.g. Delete a job waiting in queue that has been preemptively terminated by user
  - Use DecreaseKey(P,  $\Delta$ ,H) followed by DeleteMin
  - Running Time:  $O(\log N)$

# Other Heap Operations

- Merge(H1,H2): Merge two heaps H1 and H2 of size  $O(N)$ . H1 and H2 are stored in two arrays.
  - Can do  $O(N)$  Insert operations:  $O(N \log N)$  time
  - Better: Copy H2 at the end of H1 and use BuildHeap. Running Time:  $O(N)$

# Heap Sort

- Idea: buildHeap then call deleteMin  $n$  times

```
E[] input = buildHeap(...);
E[] output = new E[n];
for (int i = 0; i < n; i++) {
    output[i] = deleteMin(input);
}
```

- Runtime?  
Best-case \_\_\_\_ Worst-case \_\_\_\_ Average-case \_\_\_\_
- Stable? \_\_\_\_\_
- In-place? \_\_\_\_\_

# Heap Sort

- Idea: `buildHeap` then call `deleteMin`  $n$  times

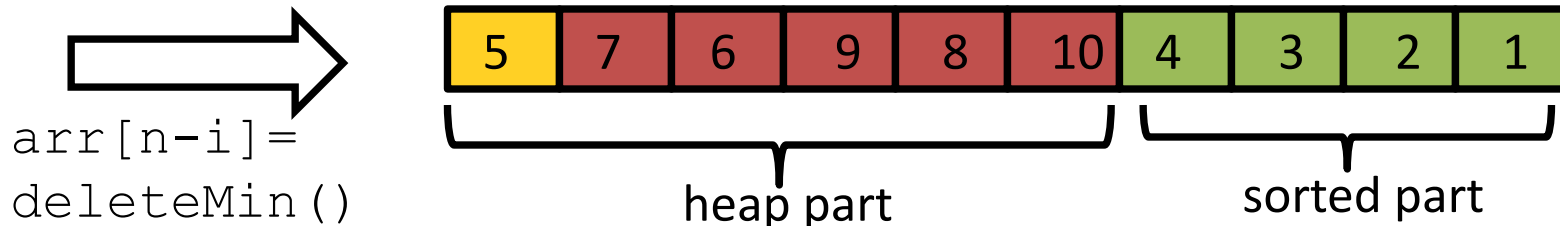
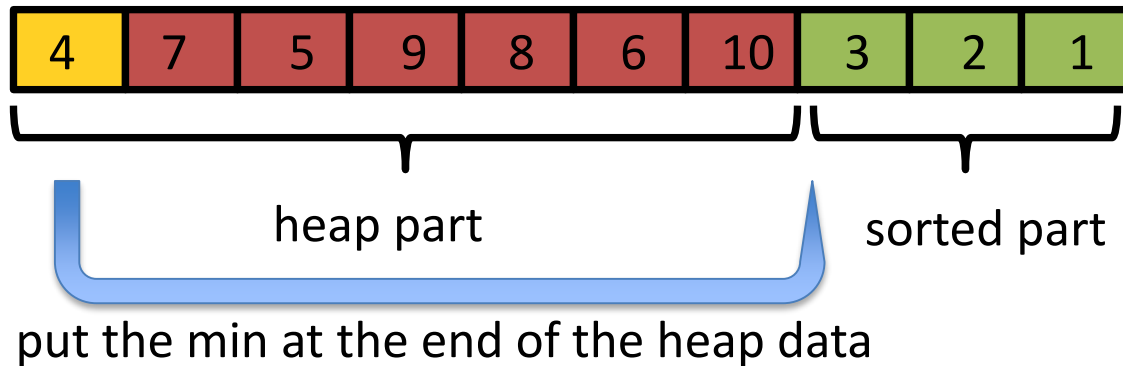
```
E[] input = buildHeap(...);
E[] output = new E[n];
for (int i = 0; i < n; i++) {
    output[i] = deleteMin(input);
}
```

- Runtime?  
Best-case, Worst-case, and Average-case:  $O(n \log(n))$
- Stable? **No**
- In-place? **No. But it could be, with a slight trick...**

# In-place Heap Sort

But this reverse sorts –  
how would you fix that?

- Treat the initial array as a heap (via `buildHeap`)
- When you delete the  $i^{\text{th}}$  element, put it at `arr[n-i]`
  - That array location isn't needed for the heap anymore!



# “AVL sort”? “Hash sort”?

**AVL Tree:** sure, we can also use an AVL tree to:

- **insert** each element: total time  $O(n \log n)$
- Repeatedly **deleteMin**: total time  $O(n \log n)$ 
  - Better: in-order traversal  $O(n)$ , but still  $O(n \log n)$  overall
- But this cannot be done in-place and has worse constant factors than heap sort