

CSE 332 Winter 2024

Lecture 6: Priority Queues and recurrences

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ADT: Priority Queue

- What is it?
 - A collection of items and their “priorities”
 - Allows quick access/removal to the “top priority” thing
- What Operations do we need?
 - insert(item, priority)
 - Add a new item to the PQ with indicated priority
 - Usually, smaller priority value means more important
 - deleteMin
 - Remove and return the “top priority” item from the queue
 - is_empty
 - Indicate whether or not there are items still on the queue
- Note: the “priority” value can be any type/class so long as it’s comparable (i.e. you can use “<” or “compareTo” with it)

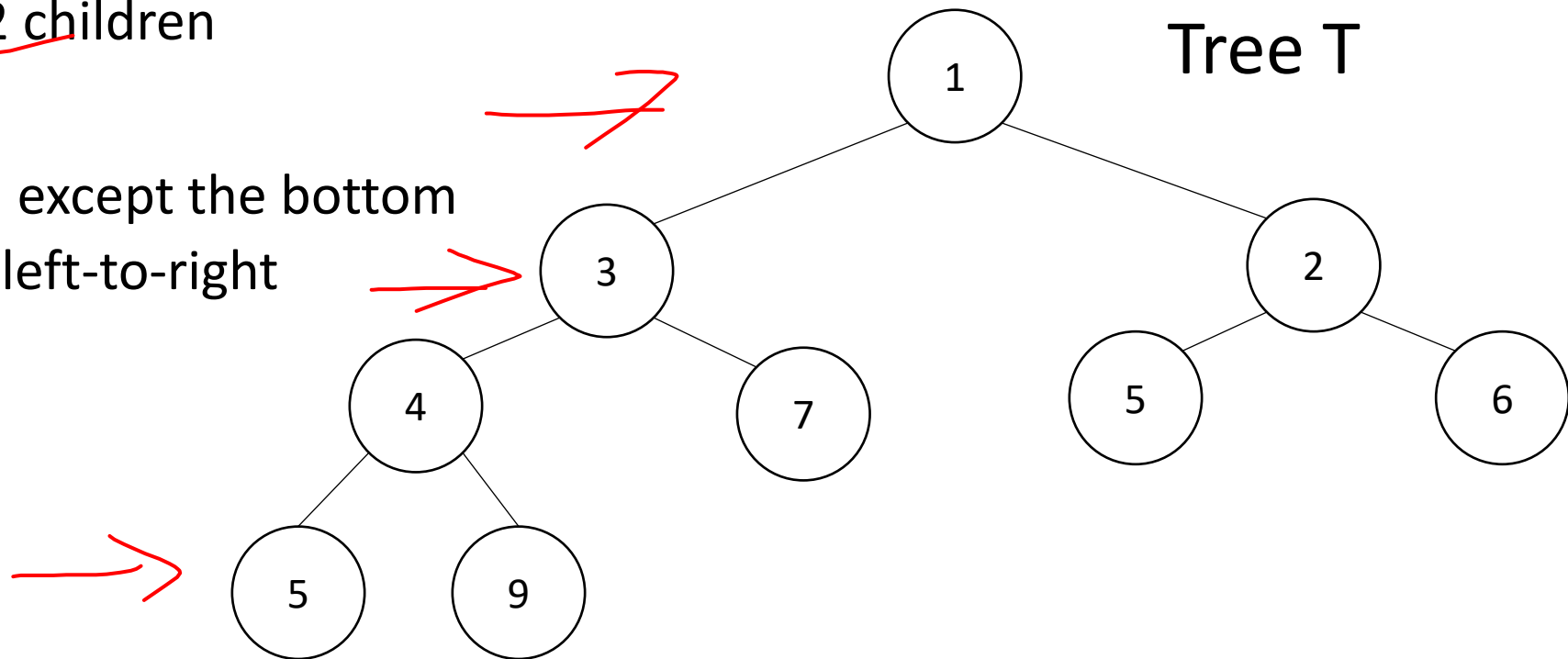
Thinking through implementations

Data Structure	Worst case time to insert	Worst case time to deleteMin
Unsorted Array	$\Theta(1)$	$\Theta(n)$
Unsorted Linked List	$\Theta(1)$	$\Theta(n)$
Sorted Array	$\Theta(n)$	$\Theta(n)$
Sorted Linked List	$\Theta(n)$	$\Theta(1)$
Binary Search Tree	$\Theta(n)$	$\Theta(n)$
Binary Heap	$\Theta(\log n)$	$\Theta(\log n)$

Note: Assume we know the maximum size of the PQ in advance

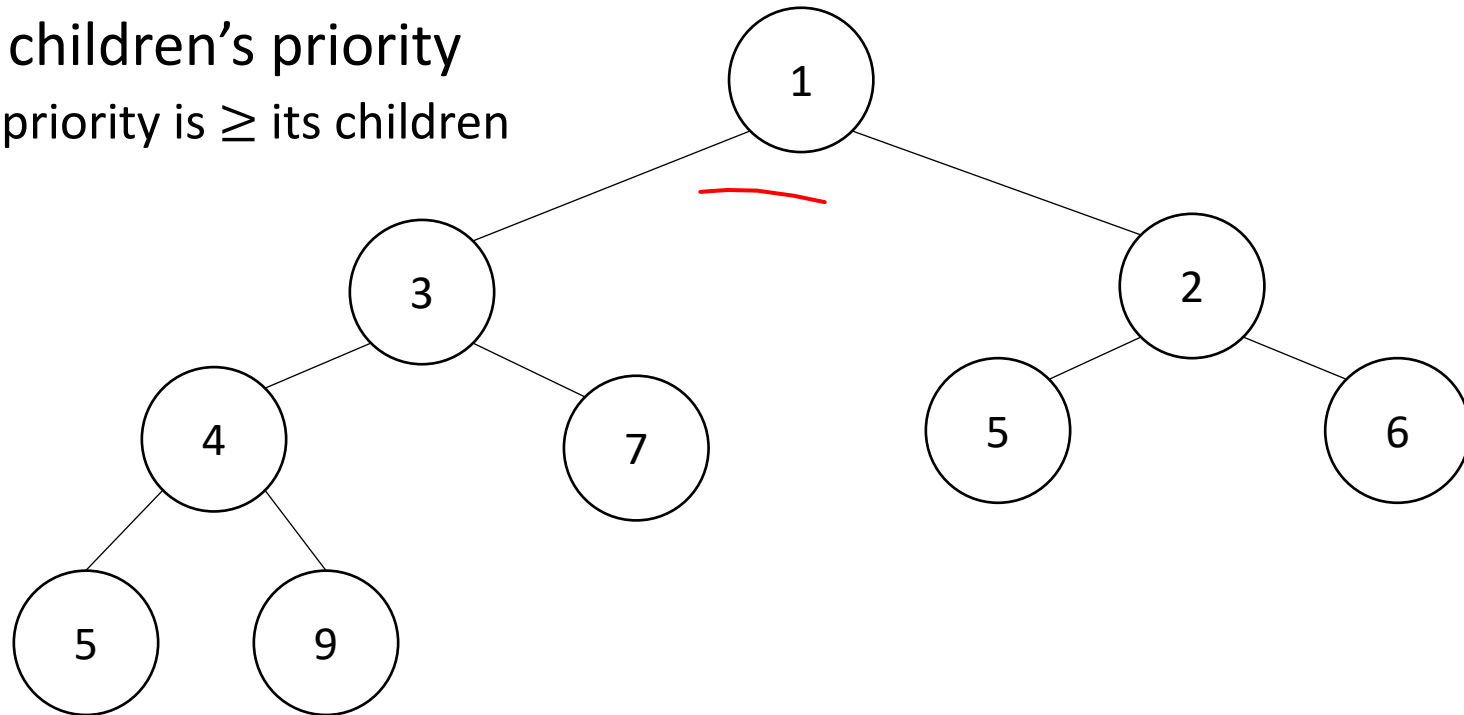
Trees for Heaps

- Binary Trees:
 - The branching factor is 2
 - Every node has ≤ 2 children
- Complete Tree:
 - All “layers” are full, except the bottom
 - Bottom layer filled left-to-right



(Min) Heap Data Structure

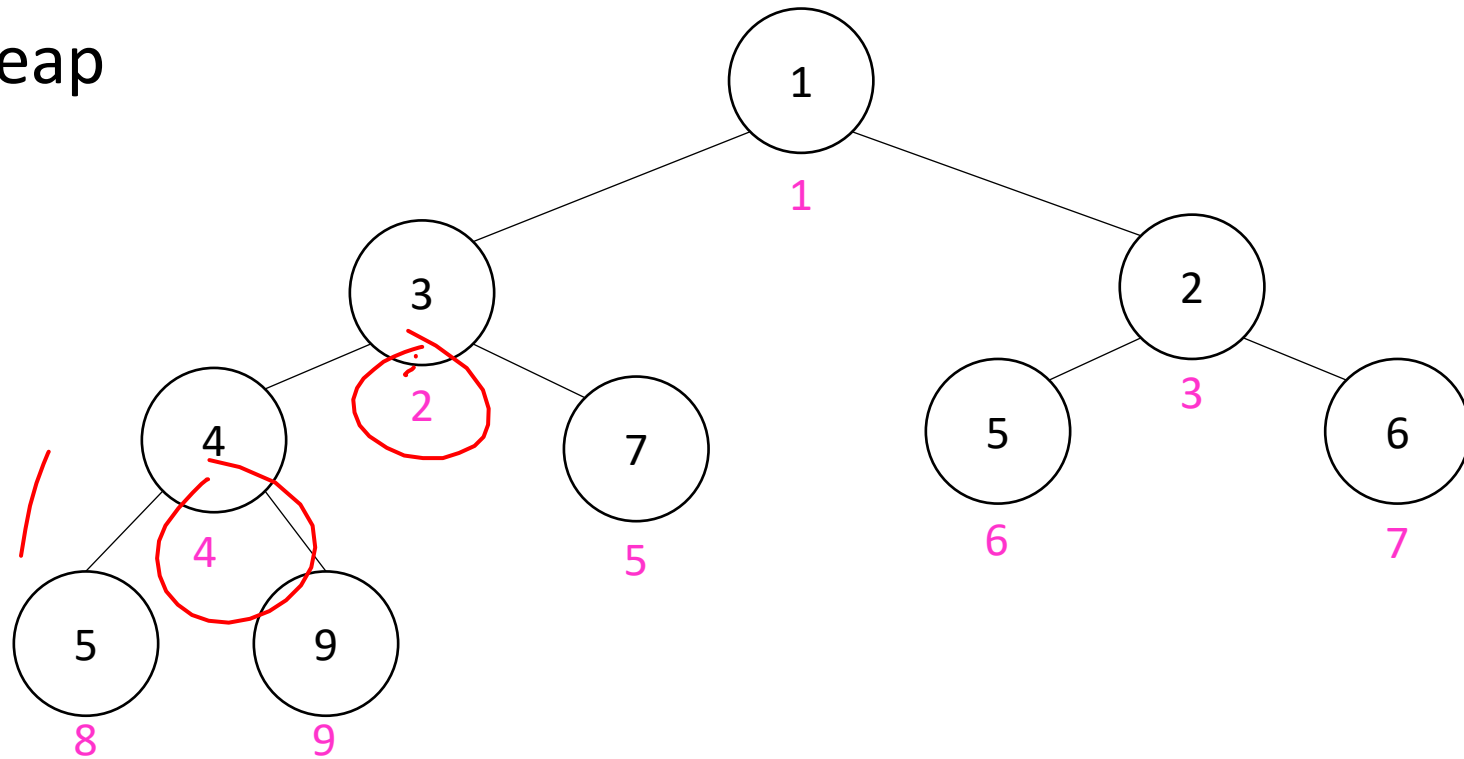
- Keep items in a complete binary tree
- Maintain the “(Min) Heap Property” of the tree
 - Every node’s priority is \leq its children’s priority
 - Max Heap Property: every node’s priority is \geq its children



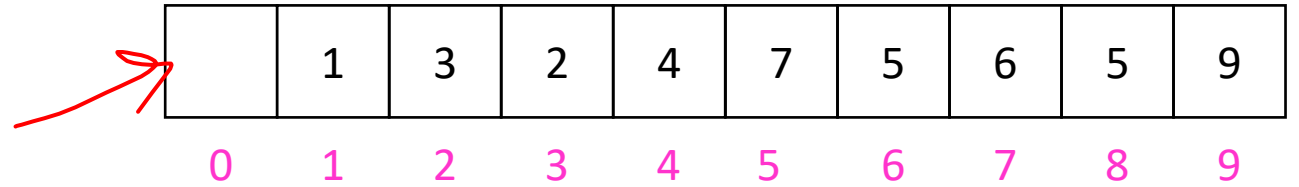
Representing a Heap

	1	3	2	4	7	5	6	5	9
0	1	2	3	4	5	6	7	8	9

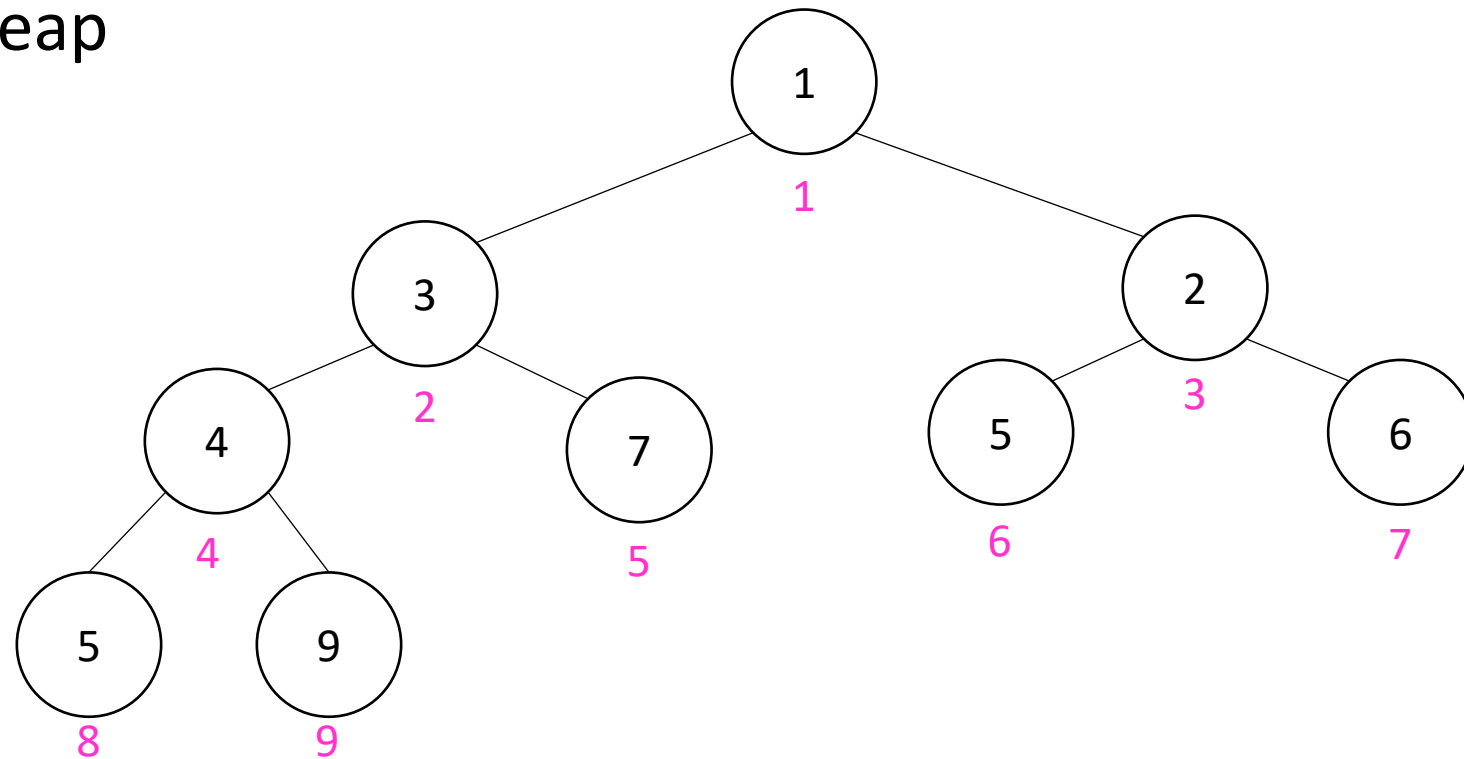
- Every complete binary tree with the same number of nodes uses the same positions and edges
- Use an array to represent the heap
- Index of root: 1
- Parent of node i : $\lfloor \frac{i}{2} \rfloor$
- Left child of node i : $2i$
- Right child of node i : $2i + 1$
- Location of the leaves:



Representing a Heap



- Every complete binary tree with the same number of nodes uses the same positions and edges
- Use an array to represent the heap
- Index of root: 1
- Parent of node i : $\lfloor \frac{i}{2} \rfloor$
- Left child of node i : $2i$
- Right child of node i : $2i + 1$
- Location of the leaves: last $\lfloor \frac{n}{2} \rfloor$



Representing a Heap

1	3	2	4	7	5	6	5	9
0	1	2	3	4	5	6	7	8

- Every complete binary tree with the same number of nodes uses the same positions and edges

- Use an array to represent the heap

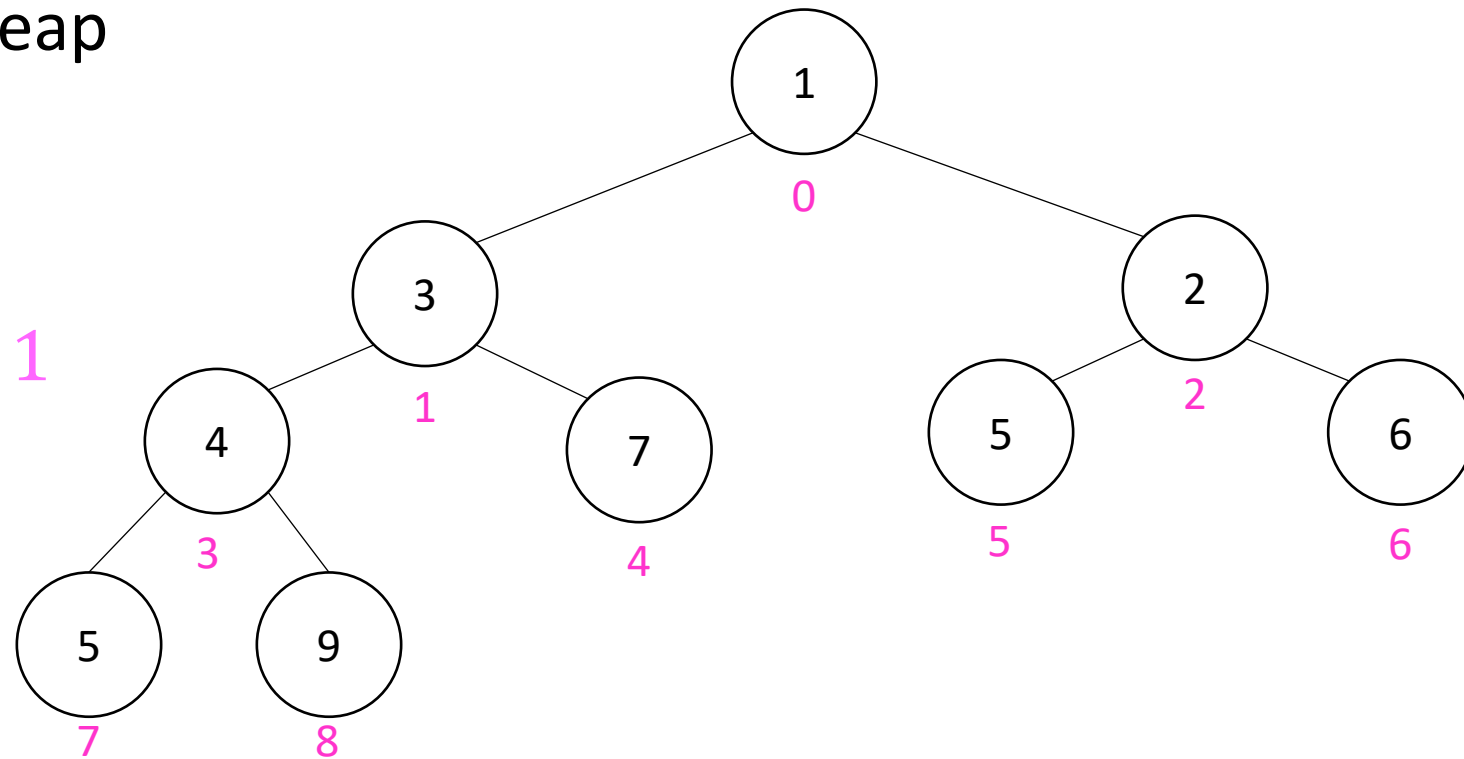
- Index of root: 0

- Parent of node i : $\left\lfloor \frac{i+1}{2} \right\rfloor - 1$

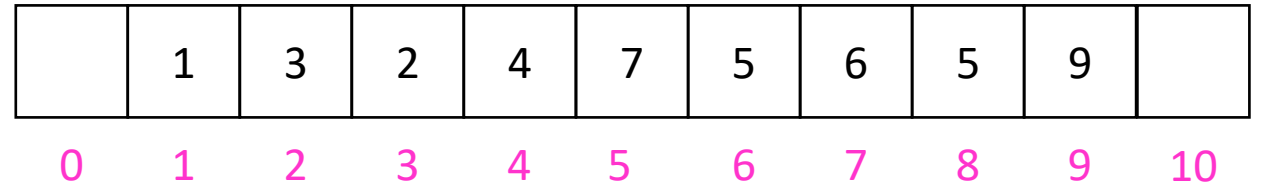
- Left child of node i : $2(i+1) - 1$

- Right child of node i : $2(i+1)$

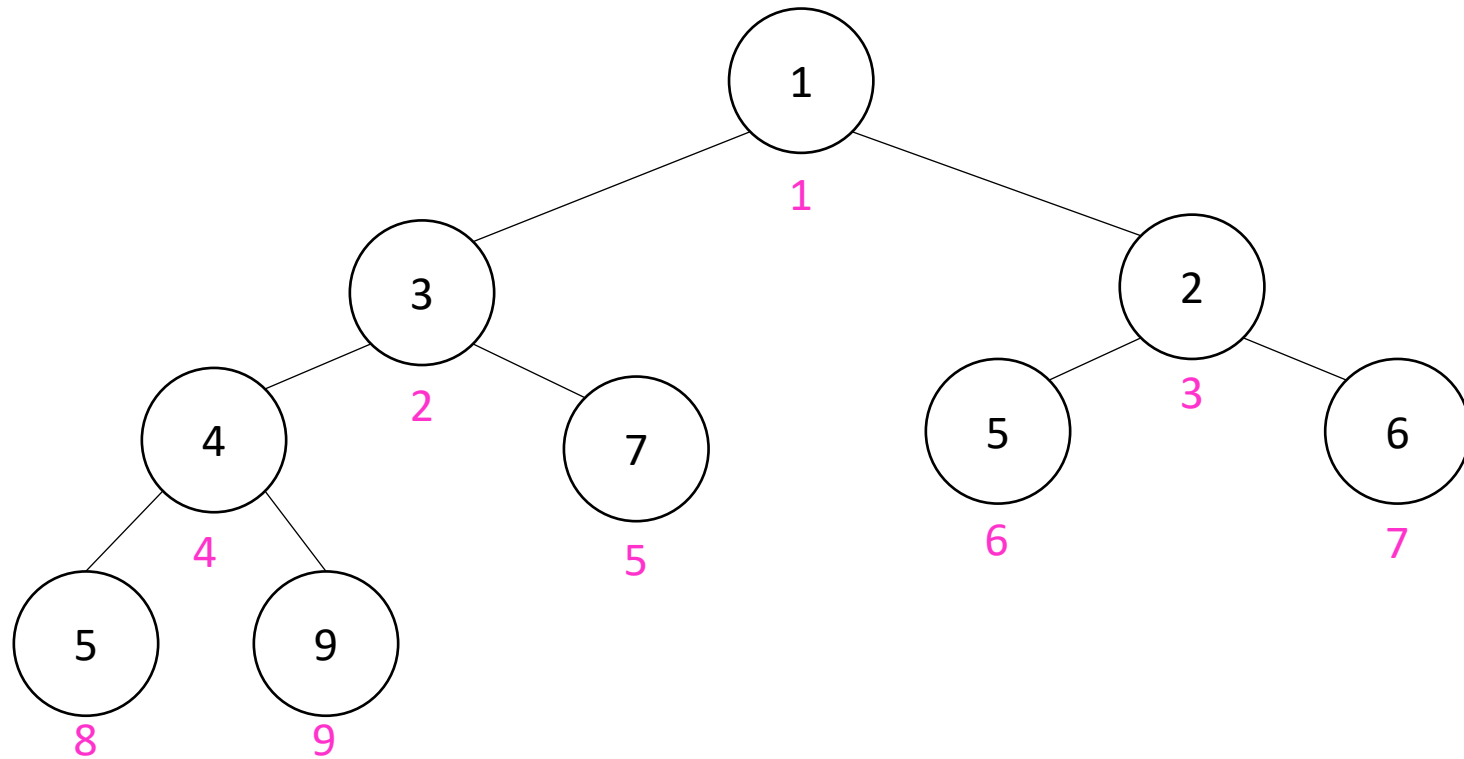
- Location of the leaves: last $\left\lfloor \frac{n}{2} \right\rfloor$



Insert Pseudocode

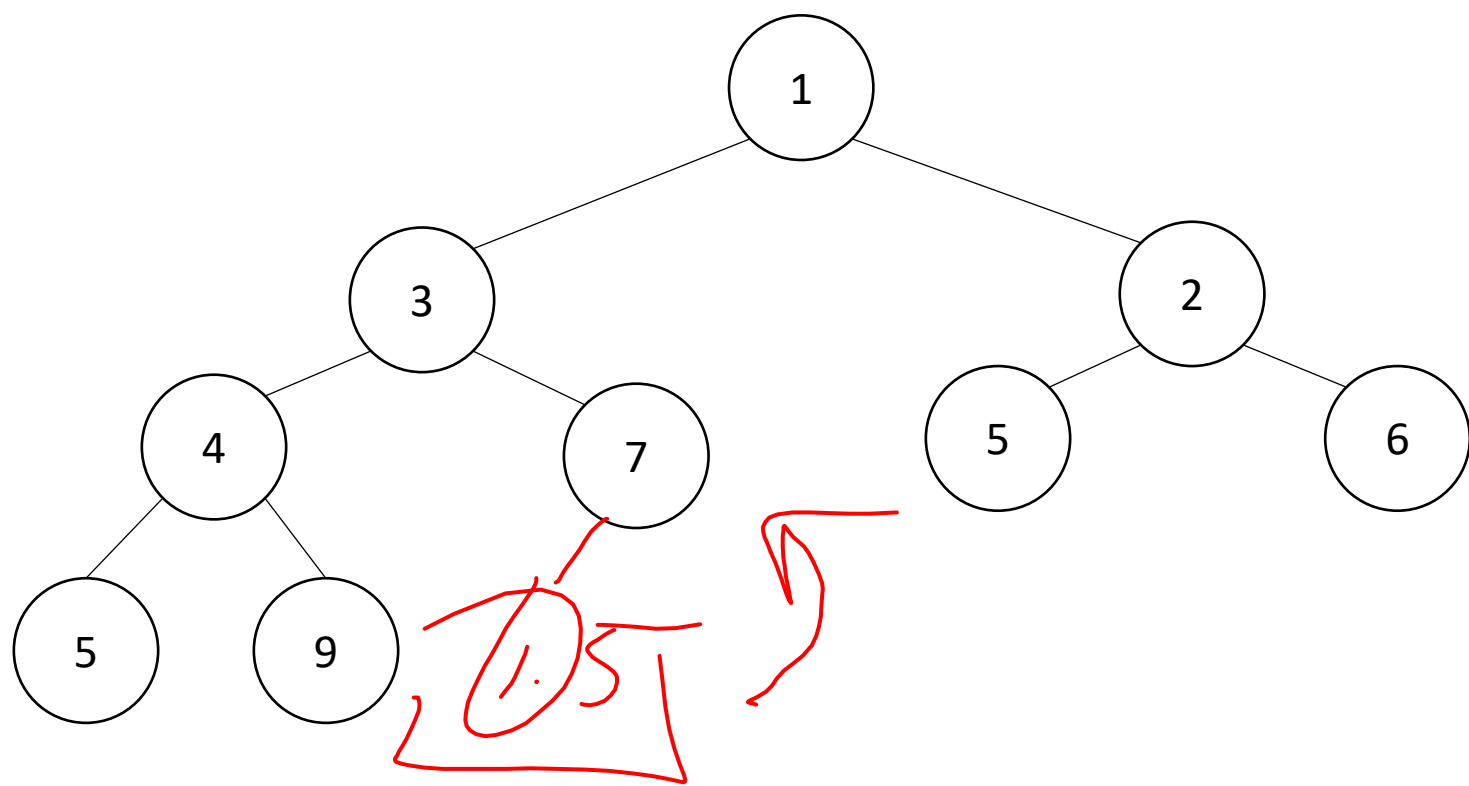


```
insert(item){  
    if(size == arr.length - 1){resize();}  
    size++;  
    arr[i] = item;  
    percolateUp(i)  
}
```



Heap Insert

1.5



```
insert(item){
```

```
    put item in the "next open" spot (keep tree complete)
```

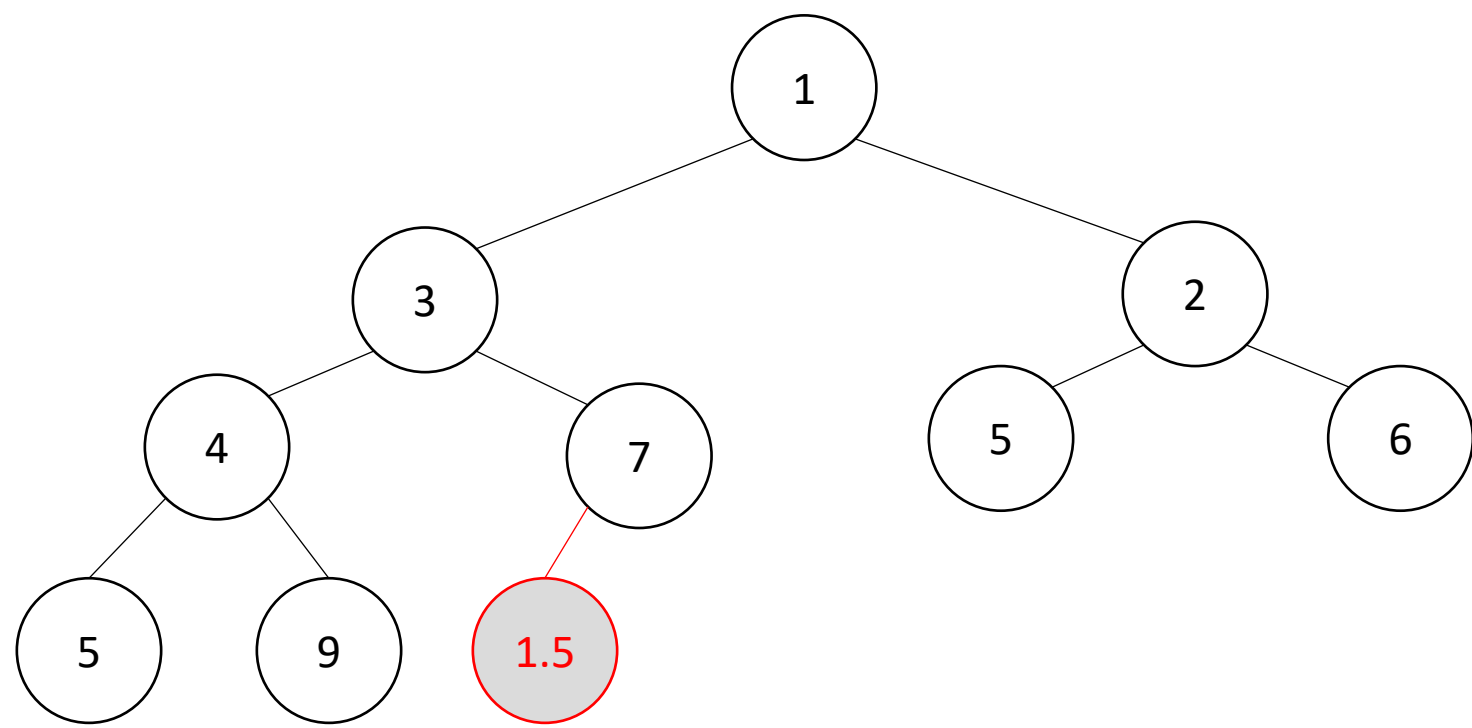
```
    while (item.priority < parent(item).priority){
```

```
        swap item with parent
```

```
    }
```

```
}
```

Heap Insert



```
insert(item){
```

```
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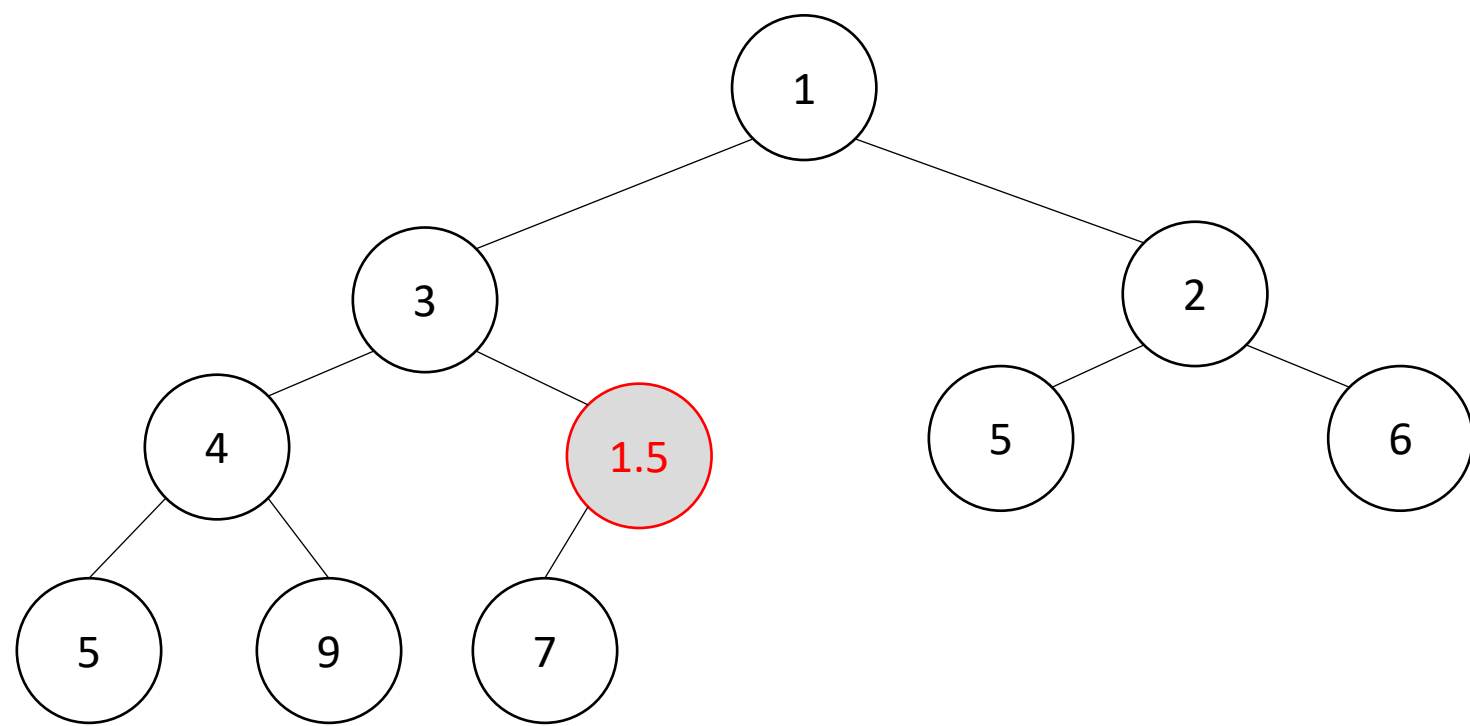
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Heap Insert



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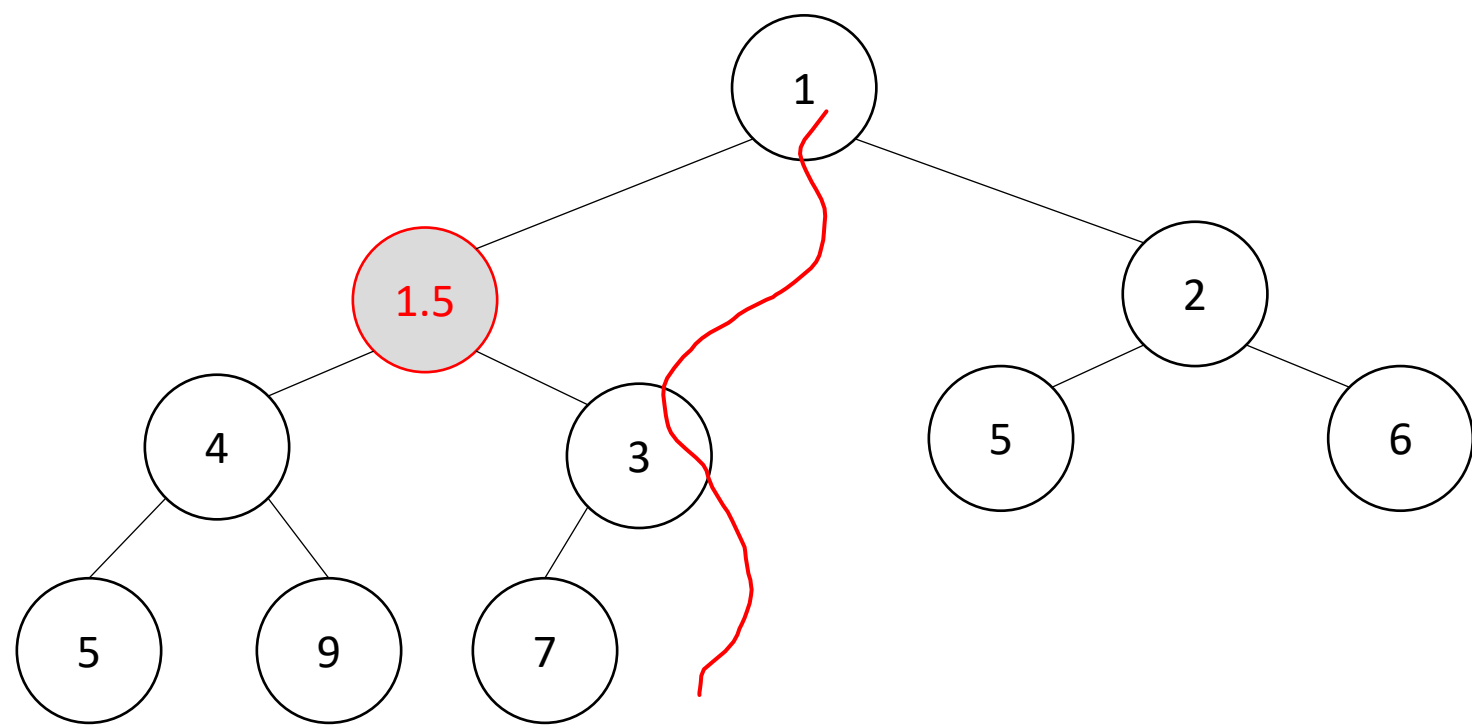
```
    swap item with parent
```

```
  }
```

```
}
```

Percolate Up

Heap Insert



```
insert(item){
```

```
  put item in the "next open" spot (keep tree complete)
```

```
  while (item.priority < parent(item).priority){
```

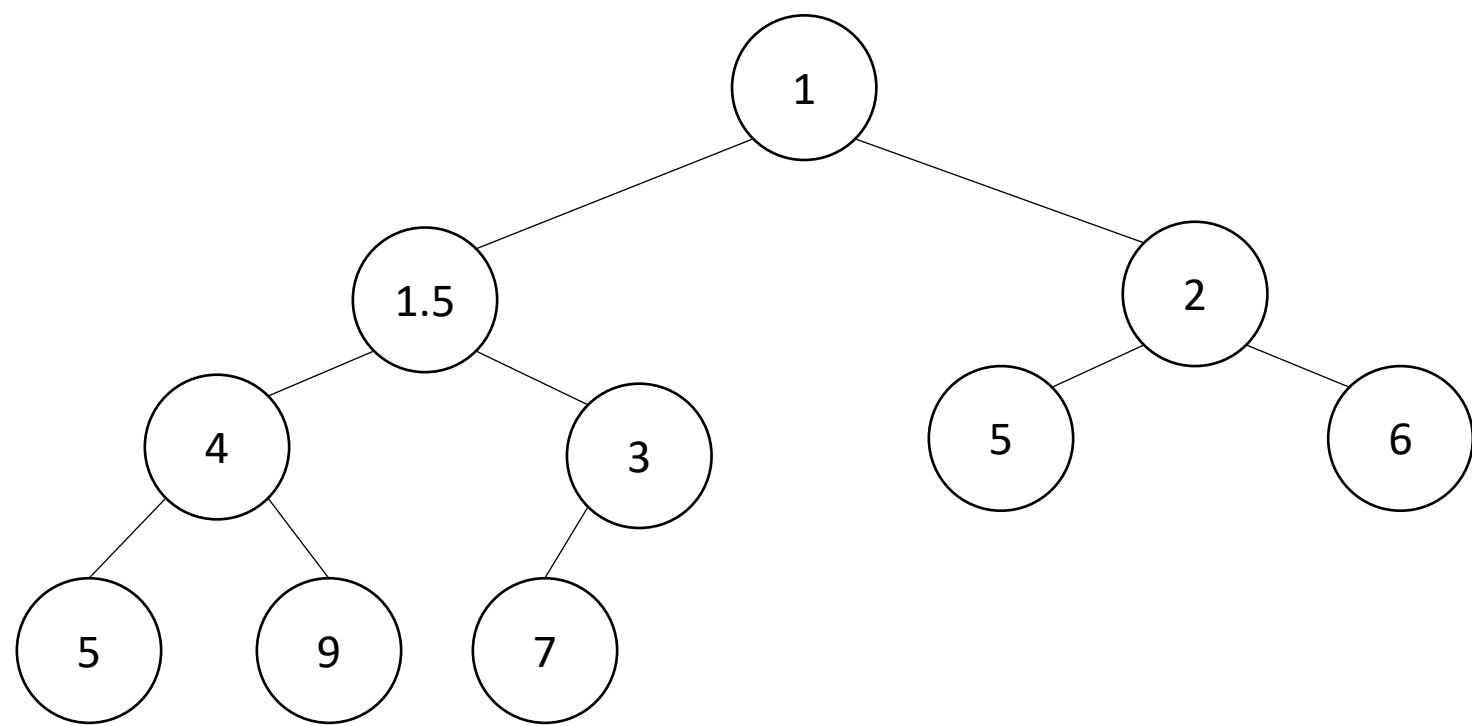
```
    swap item with parent
```

```
  }
```

```
}
```

Percolate Up

Heap Insert



```
insert(item){
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    put item in the “next open” spot (keep tree complete)
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```
    while (item.priority < parent(item).priority){
```

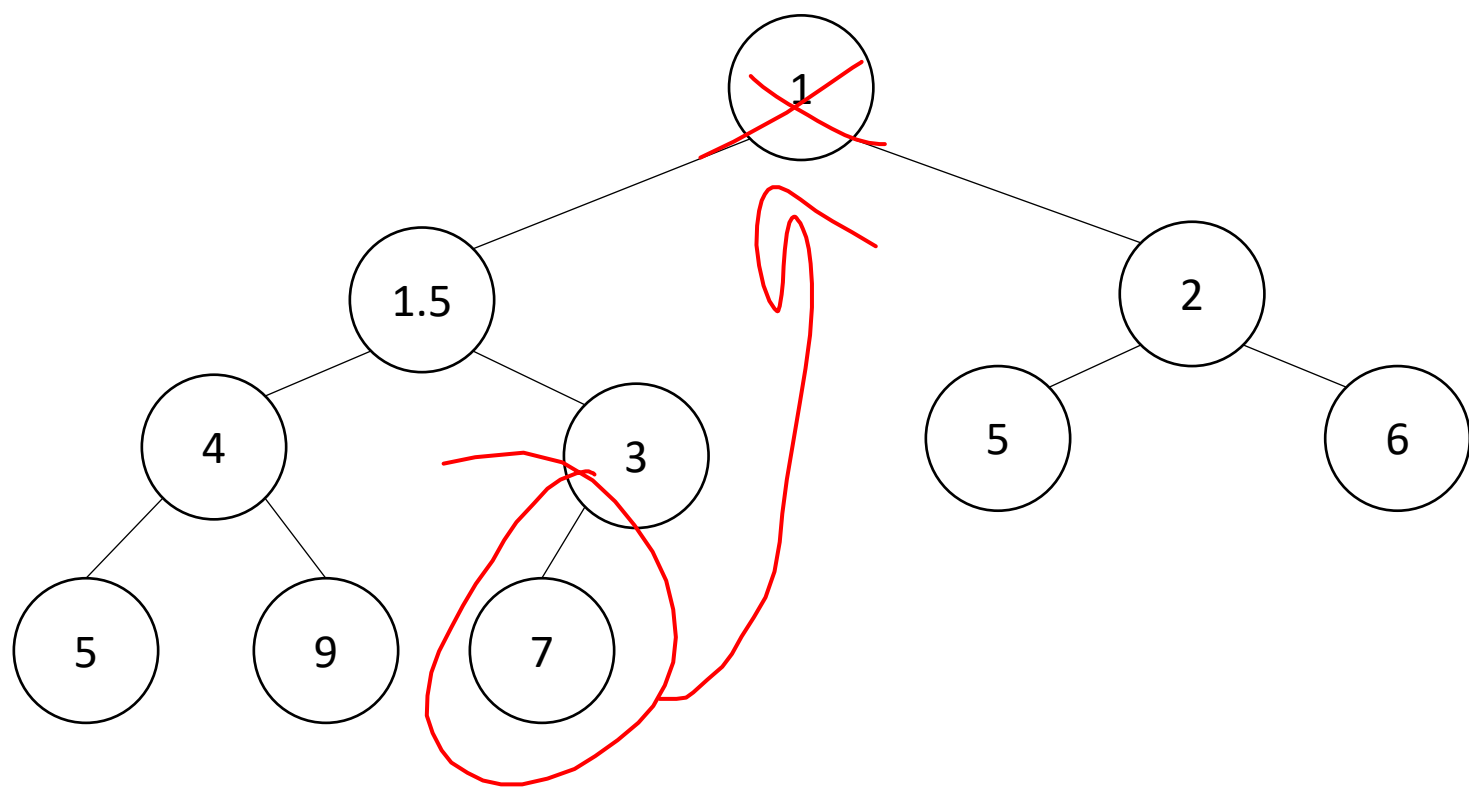
```
        swap item with parent
```

```
    }
```

```
}
```

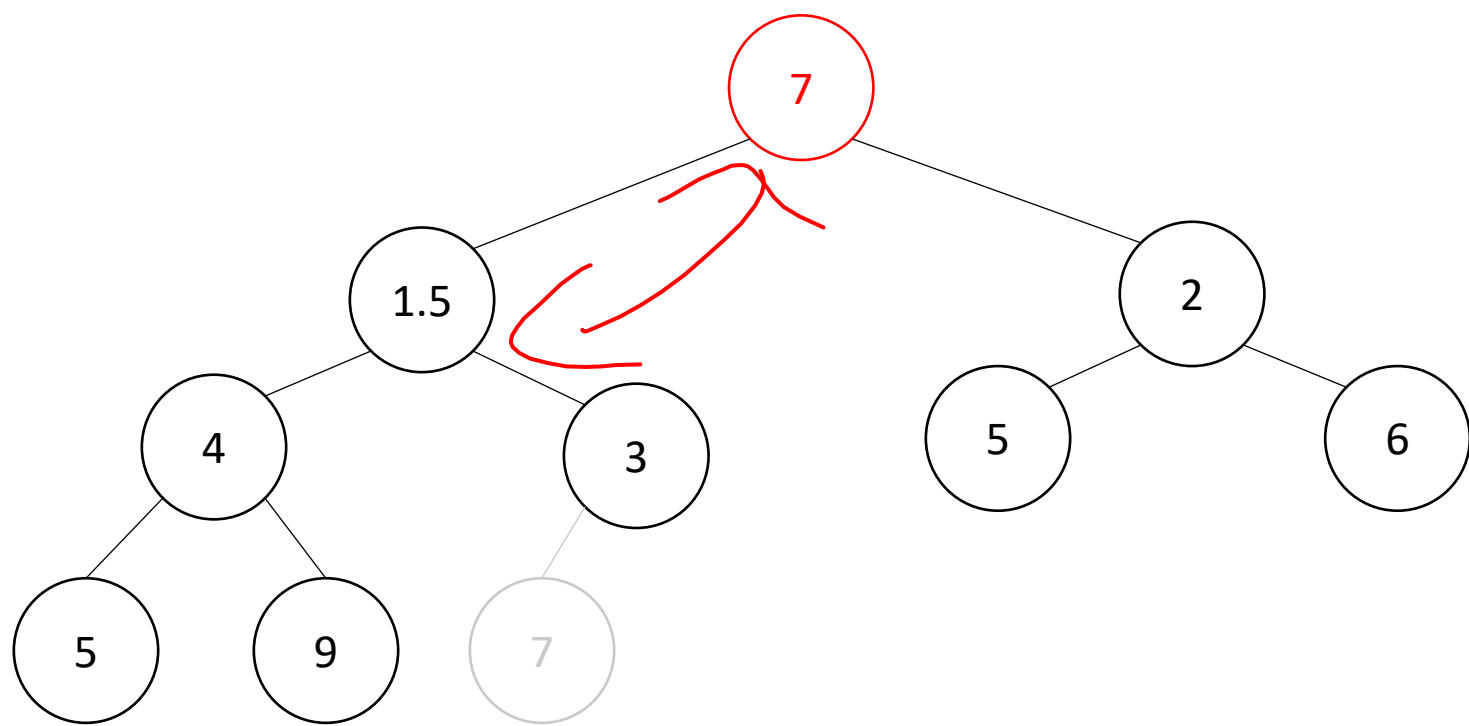
Heap deleteMin

```
deleteMin(){  
  min = root  
  br = bottom-right item  
  move br to the root  
  while(br > either of its children){  
    swap br with its smallest child  
  }  
  return min  
}
```



Heap deleteMin

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deleteMin(){  
  min = root  
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  move br to the root  
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```



Heap deleteMin

```
deleteMin(){
```

```
  min = root
```

```
  br = bottom-right item
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  move br to the root
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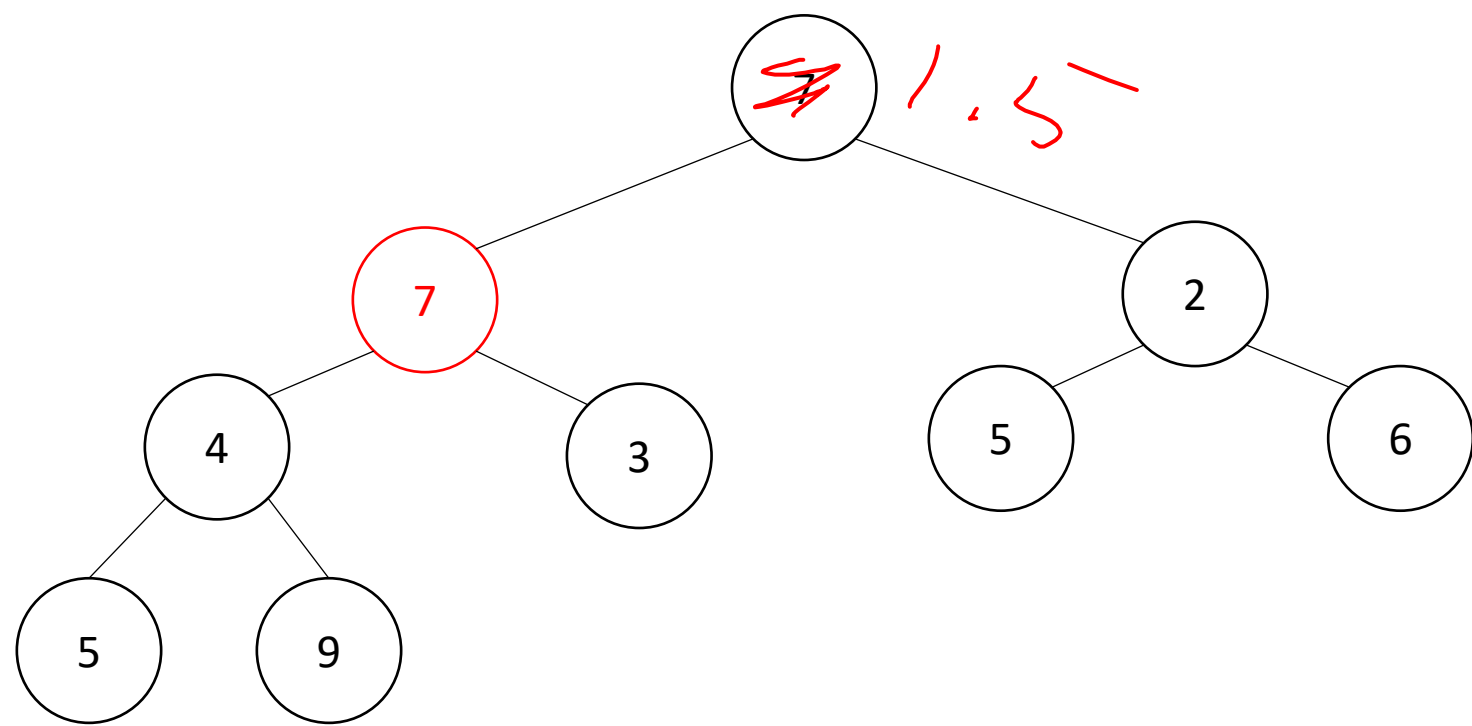
```
  while(br > either of its children){
```

```
    swap br with its smallest child
```

```
  }
```

```
  return min
```

```
}
```



Percolate Down

Heap deleteMin

```
deleteMin(){
```

```
  min = root
```

```
  br = bottom-right item
```

```
  move br to the root
```

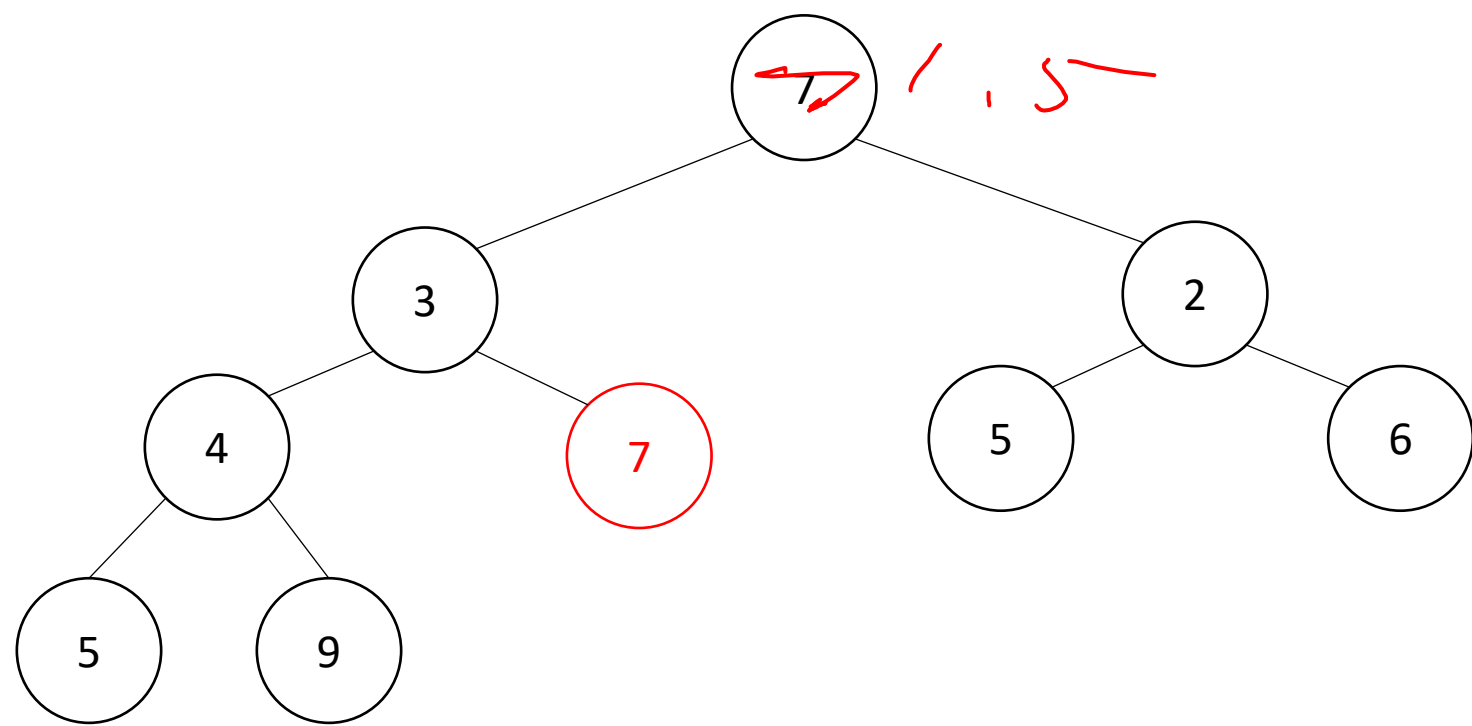
```
  while(br > either of its children){
```

```
    swap br with its smallest child
```

```
  }
```

```
  return min
```

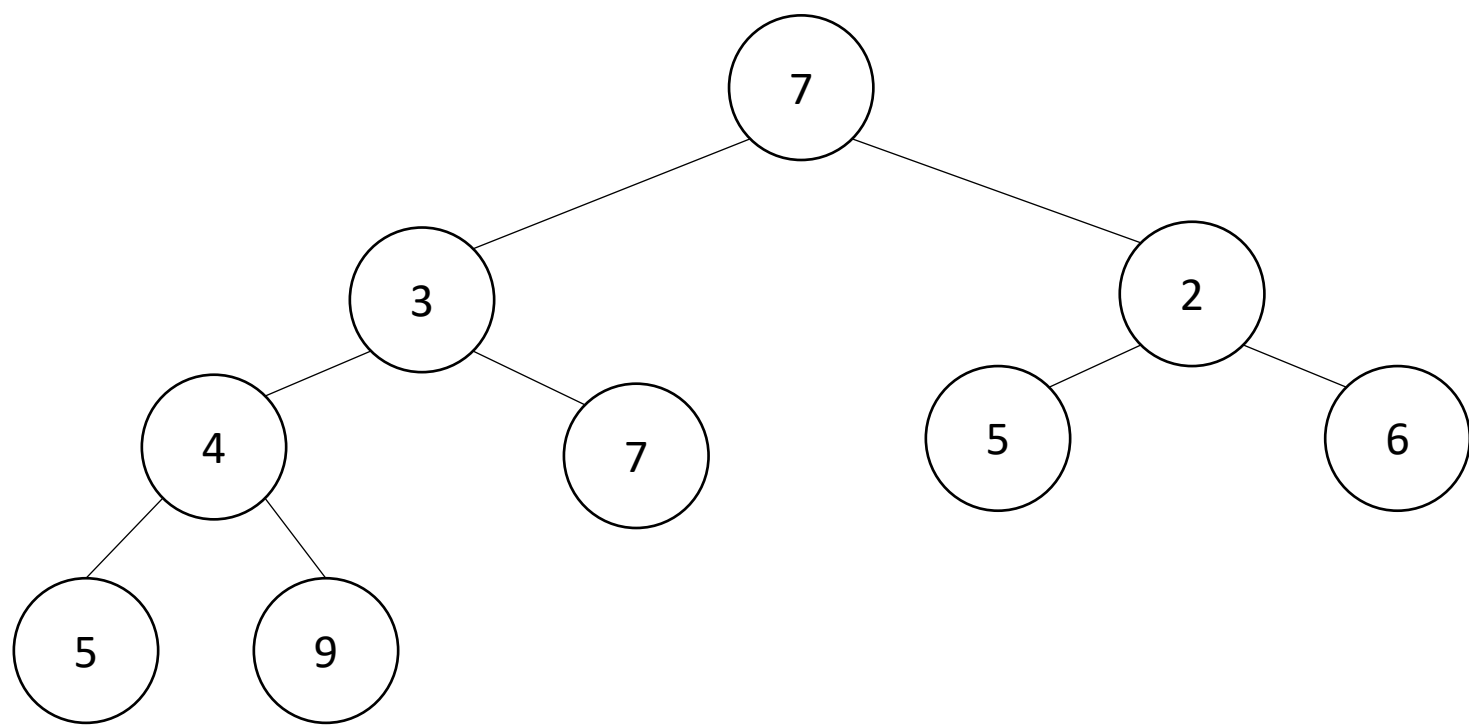
```
}
```



Percolate Down

Heap deleteMin

```
deleteMin(){  
  min = root  
  br = bottom-right item  
  move br to the root  
  while(br > either of its children){  
    swap br with its smallest child  
  }  
  return min  
}
```



Percolate Up and Down (for a Min Heap)

- Goal: restore the “Heap Property”
- Percolate Up:
 - Take a node that may be smaller than a parent, repeatedly swap with a parent until it is larger than its parent
- Percolate Down:
 - Take a node that may be larger than one of its children, repeatedly swap with smallest child until both children are larger
- Worst case running time of each:
 - $\Theta(\log n)$

Percolate Up

```
percolateUp(int i){  
    int parent = i/2; \\ index of parent  
    Item val = arr[i]; \\ value at current location  
    while(i > 1 && arr[i].priority < arr[parent].priority){ \\ until location is root or heap property holds  
        arr[i] = arr[parent]; \\ move parent value to this location  
        arr[parent] = val; \\ put current value into parent's location  
        i = parent; \\ make current location the parent  
        parent = i/2; \\ update new parent  
    }  
}
```

DeleteMin Psuedocode

```
deleteMin(){  
    theMin = arr[1];  
    arr[1] = arr[size];  
    size--;  
    percolateDown(1);  
    return theMin;  
}
```

Percolate Down

```
percolateDown(int i){
    int left = i*2; \\ index of left child
    int right = i*2+1; \\ index of right child
    Item val = arr[i]; \\ value at location
    while(left <= size){ \\ until location is leaf
        int toSwap = right;
        if(right > size || arr[left].priority < arr[right] .priority){ \\ if there is no right child or if left child is smaller
            toSwap = left; \\ swap with left
        } \\ now toSwap has the smaller of left/right, or left if right does not exist
        if (arr[toSwap] .priority < val.priority){ \\ if the smaller child is less than the current value
            arr[i] = arr[toSwap];
            arr[toSwap] = val; \\ swap parent with smaller child
            i = toSwap; \\ update current node to be smaller child
            left = i*2;
            right = i*2+1;
        }
        else{ return;} \\ if we don't swap, then heap property holds
    }
}
```

Other Operations

- Increase Key

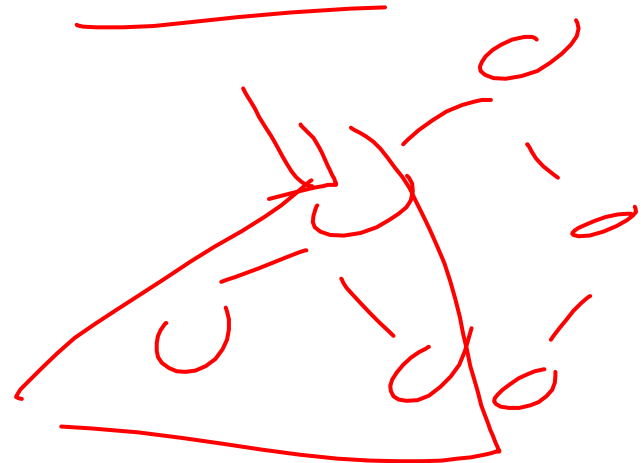
- Given the index of an item in the PQ, make its priority value larger
 - Min Heap: Then percolate down
 - Max Heap: Then percolate up

- Decrease Key

- Given the index of an item in the PQ, make its priority value smaller
 - Min Heap: Then percolate up
 - Max Heap: Then percolate down

- Remove

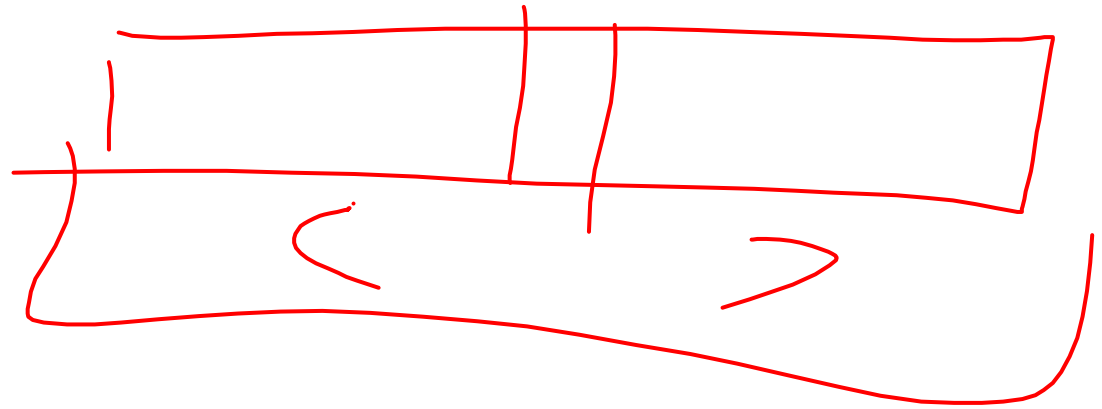
- Given the item at the given index from the PQ



$$T(N) = T\left(\frac{N}{2}\right) + C$$

Binary Search

$$T(1) = 1$$



```
search(value, sortedArr){  
    return helper(value, sortedArr, 0, sortedArr.length);  
}
```

```
helper(value, arr, low, high){  
    if (low == high){ return false; }  
    mid = (high + low) / 2;  
    if (arr[mid] == value){ return true; }  
    if (arr[mid] < value){ return helper(value, arr, mid+1, high); }  
    else { return helper(value, arr, low, mid); }  
}
```

$$T\left(\frac{N}{2}\right)$$

Analysis of Recursive Algorithms

- Overall structure of recursion:
 - Do some non-recursive “work”
 - Do one or more recursive calls on some portion of your input
 - Do some more non-recursive “work”
 - Repeat until you reach a base case
- Running time: $T(n) = T(p_1) + T(p_2) + \dots + T(p_x) + f(n)$
 - The time it takes to run the algorithm on an input of size n is:
 - The sum of how long it takes to run the same algorithm on each smaller input
 - Plus the total amount of non-recursive work done at that step
- Usually:
 - $T(n) = a \cdot T\left(\frac{n}{b}\right) + f(n)$
 - Called “divide and conquer”
 - $T(n) = T(n - c) + f(n)$
 - Called “chip and conquer”

How Efficient Is It?

- $T(n) = 1 + T\left(\left\lfloor \frac{n}{2} \right\rfloor\right)$
- Base case: $T(1) = 1$

$T(n)$ = “cost” of running the entire algorithm on an array of length n

Let's Solve the Recurrence!

$$\begin{aligned} T(1) &= 1 \\ \rightarrow T(n) &= 1 + \cancel{T(n/2)} \\ &\quad 1 + \cancel{T(n/4)} \\ &\quad 1 + \cancel{T(n/8)} \\ &\quad \dots \\ &\quad 1 \end{aligned}$$

$$T\left(\frac{n}{2}\right) = 1 + T\left(\frac{n}{4}\right)$$

Substitute until $T(1)$
So $\log_2 n$ steps

$$T(n) = \sum_{i=1}^{\log_2 n} 1 = \log_2 n$$

$$\begin{aligned} T(1) &= T\left(\frac{n}{2^i}\right) \\ 2^i &= n \\ T(n) &\in \Theta(\log n) \end{aligned}$$

$$T(n) = T\left(\frac{n}{2}\right) + 5$$

$$= T\left(\frac{n}{4}\right) + \frac{5}{2} + 5$$

$$= T\left(\frac{n}{8}\right) + \frac{5}{4} + \frac{5}{2} + 5$$

$$T\left(\frac{n}{2}\right) = T\left(\frac{n}{4}\right) + \frac{5}{2}$$

$\Theta(n)$

Recursive Linear Search

$$T(n) = C + T(n-1)$$

$$T(1) = 1$$

```
search(value, list){  
    if(list.isEmpty()){  
        return false;  
    }  
    if (value == list[0]){  
        return true;  
    }  
    list.remove(0);  
    return search(value, list);  
}
```

$$T(n-1)$$

Unrolling Method

$$T(n-1) = T(n-2) + c$$
$$T(1)$$

- Repeatedly substitute the recursive part of the recurrence

- $T(n) = T(n-1) + c$

- $T(n) = T(n-2) + c + c$

- $T(n) = T(n-3) + c + c + c$

- ...

- $T(n) = c + c + c + \dots + c$

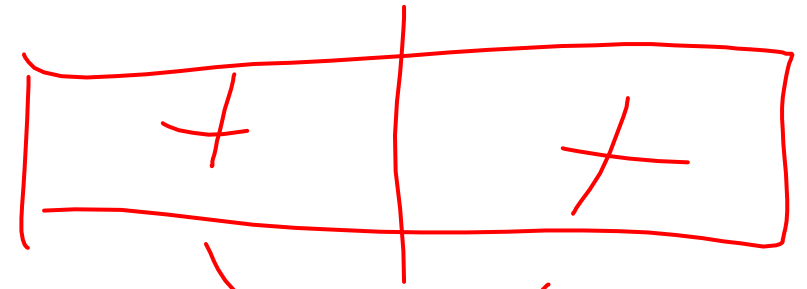
- How many c 's?

$$n-1$$

$$c(n-1)$$

$$O(n)$$

$T(n) = C + 2T(\frac{n}{2})$
Recursive List Summation



$T(n) = C + T(\frac{n}{2}) + T(\frac{n}{2})$

```
sum(list){  
    return sum_helper(list, 0, list.size);  
}  
sum_helper(list, low, high){  
    if (low == high){ return 0; }  
    if (low == high-1){ return list[low]; }  
    middle = (high+low)/2;  
    return sum_helper(list, low, middle) + sum_helper(list, middle, high);  
}
```

$T(\frac{n}{2})$ (under the first recursive call)

$T(\frac{n}{2})$ (under the second recursive call)

Loop Unrolling Method

$$T\left(\frac{n}{2}\right) = 2T\left(\frac{n}{4}\right) + c$$

$$\begin{aligned} \bullet T(n) &= 2T\left(\frac{n}{2}\right) + c = 2\left(2T\left(\frac{n}{4}\right) + c\right) + c \\ &= 4T\left(\frac{n}{4}\right) + 3c \end{aligned}$$

Loop Unrolling Method

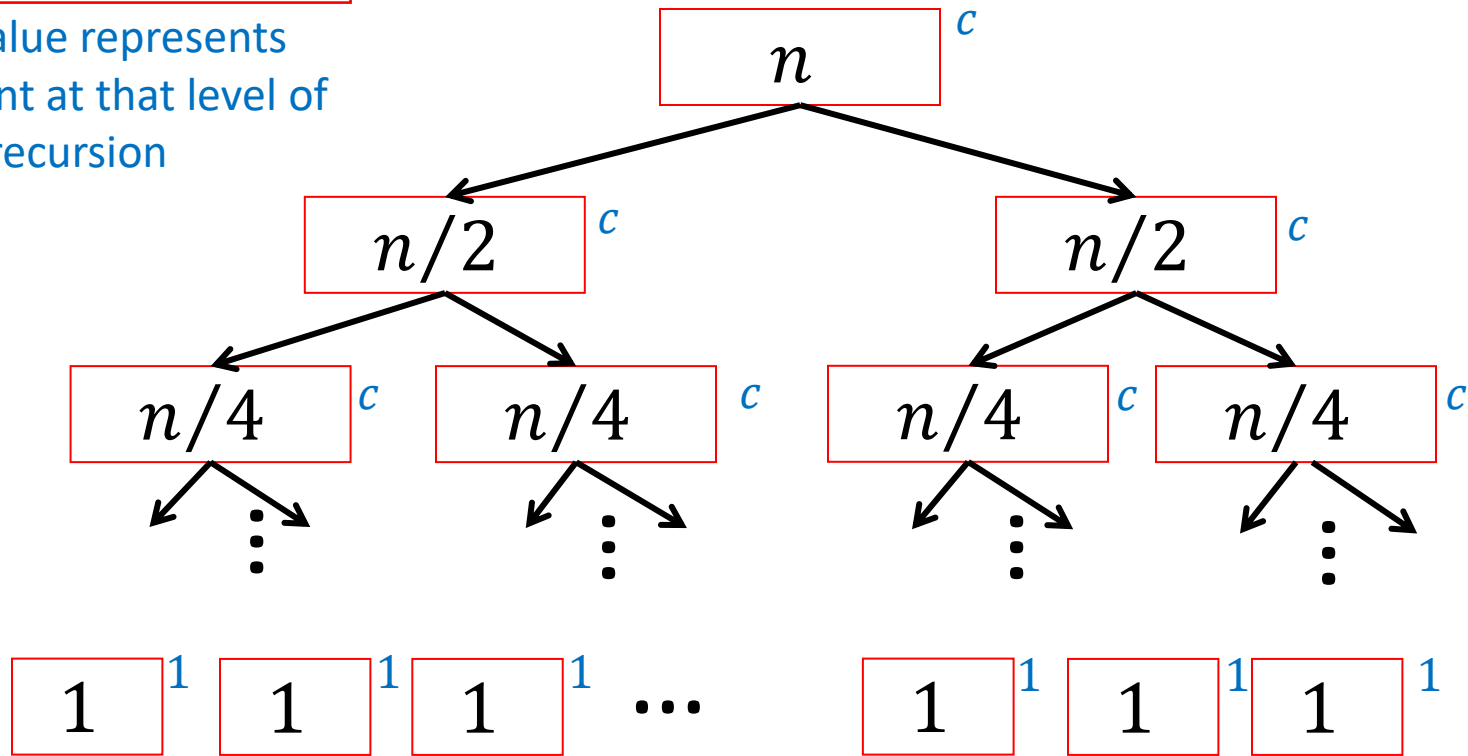
- $T(n) = 2T\left(\frac{n}{2}\right) + c$
- $T(n) = 2\left(2T\left(\frac{n}{4}\right) + c\right) + c = 4T\left(\frac{n}{4}\right) + 3c$
- $T(n) = 4\left(2T\left(\frac{n}{8}\right) + c\right) + 3c = 8T\left(\frac{n}{8}\right) + 7c$
- ...after $i - 1$ substitutions
- $T(n) = 2^i T\left(\frac{n}{2^i}\right) + (2^i - 1)c$
 - $T\left(\frac{n}{2^i}\right) = T(1)$ when $i = \log_2 n$
- $T(n) = 2^{\log_2 n} T(1) + (2^{\log_2 n} - 1)c = n \cdot c_0 + cn - c = \Theta(n)$

Tree Method

$$T(n) = 2T\left(\frac{n}{2}\right) + c$$

Red box represents a problem instance

Blue value represents time spent at that level of recursion



$\Rightarrow 2^i \cdot c$ work per level

$\log_2 n$ levels of recursion

$$T(n) = \sum_{i=1}^{\log_2 n} 2^i \cdot c$$

Recursive List Summation

$$T(n) = \sum_{i=1}^{\log_2 n} 2^i \cdot c$$

$$= c \cdot \sum_{i=1}^{\log_2 n} 2^i$$

$$= c \left(\frac{1 - 2^{\log_2 n + 1}}{1 - 2} \right)$$