

Sorting III

CS143: lecture 15

Byron Zhong, July 16

Sorting

So far...

- $O(n^2)$: Selection, insertion, bubble sorts
- $O(n \log n)$: Merge, quick sorts
- Final data structure / sorting algorithm: heap
- Note: the "heap" data structure has nothing to do with "heap" memory.

Priority Queue

- All elements have a *priority*.
- Insert elements into the data structure in any order; retrieve elements in the order of their priority (usually highest first).
- Examples include:
 - Boarding airplanes
 - Hospital triage
 - Covid vaccine eligibility

Priority Queue

- Core operations:
 - `insert(v) ;` -- insert an element (assume that priority is in `v`)
 - `get_top() ;` -- return the element with top priority
 - `remove_top() ;` -- remove the element with top priority
- Others: `size()` `is_empty()` `update_priority()` ... ignored for now

Priority Queue

Implementations

	<code>insert</code>	<code>get_top</code>	<code>remove_top</code>
ArrayList	$O(1)$	$O(n)$	$O(n)$
Sorted ArrayList	$O(n)$	$O(1)$	$O(1)$
Sorted Linked List	$O(n)$	$O(1)$	$O(1)$
General BST	$O(n)$	$O(n)$	$O(n)$
Balanced BST	$O(\log n)$	$O(\log n)$	$O(\log n)$

Heap

- A heap is an efficient implementation of priority queues.
- A heap is a binary tree satisfying the following two constraints:
 - Shape property
 - Value property

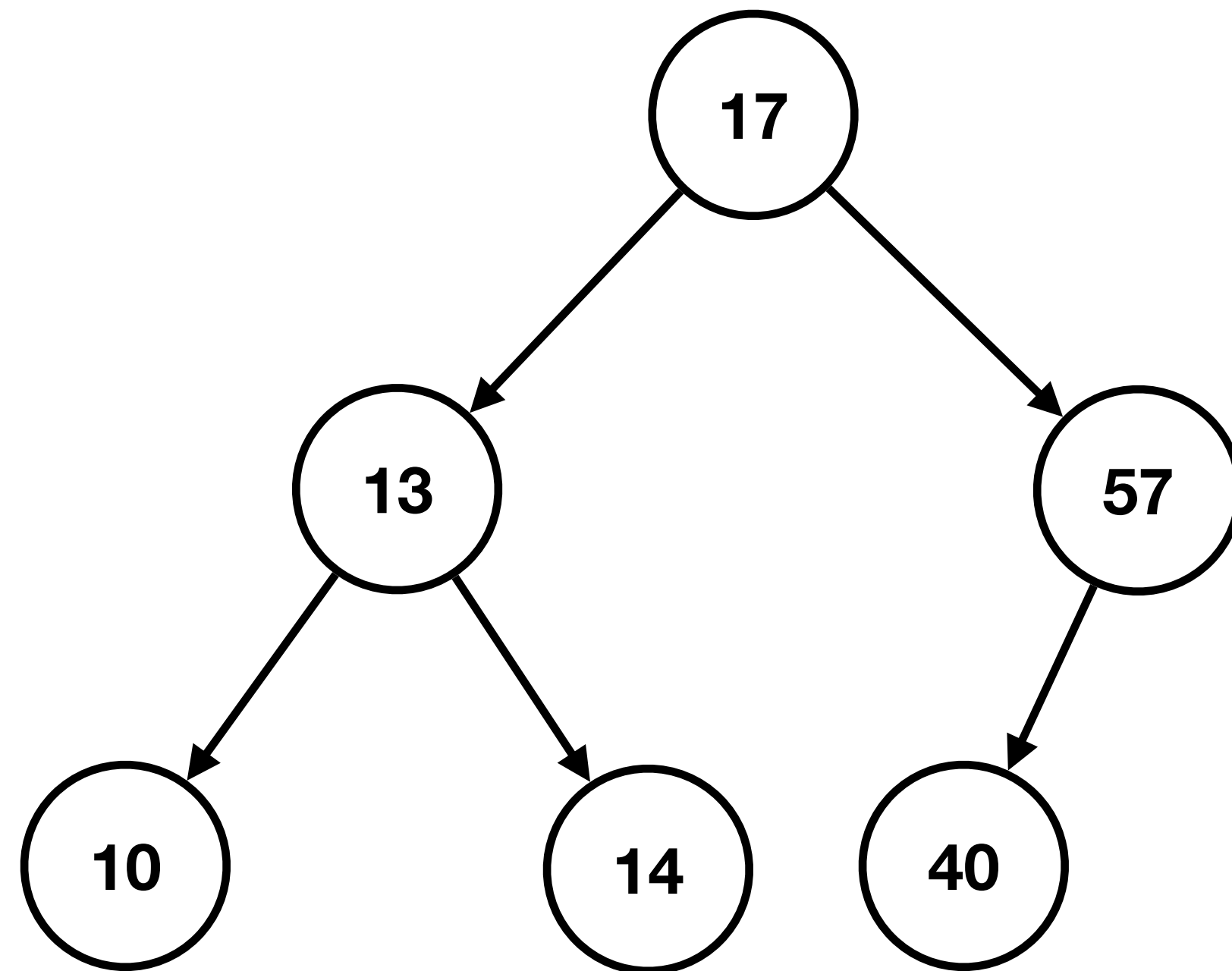
Heap

Shape property

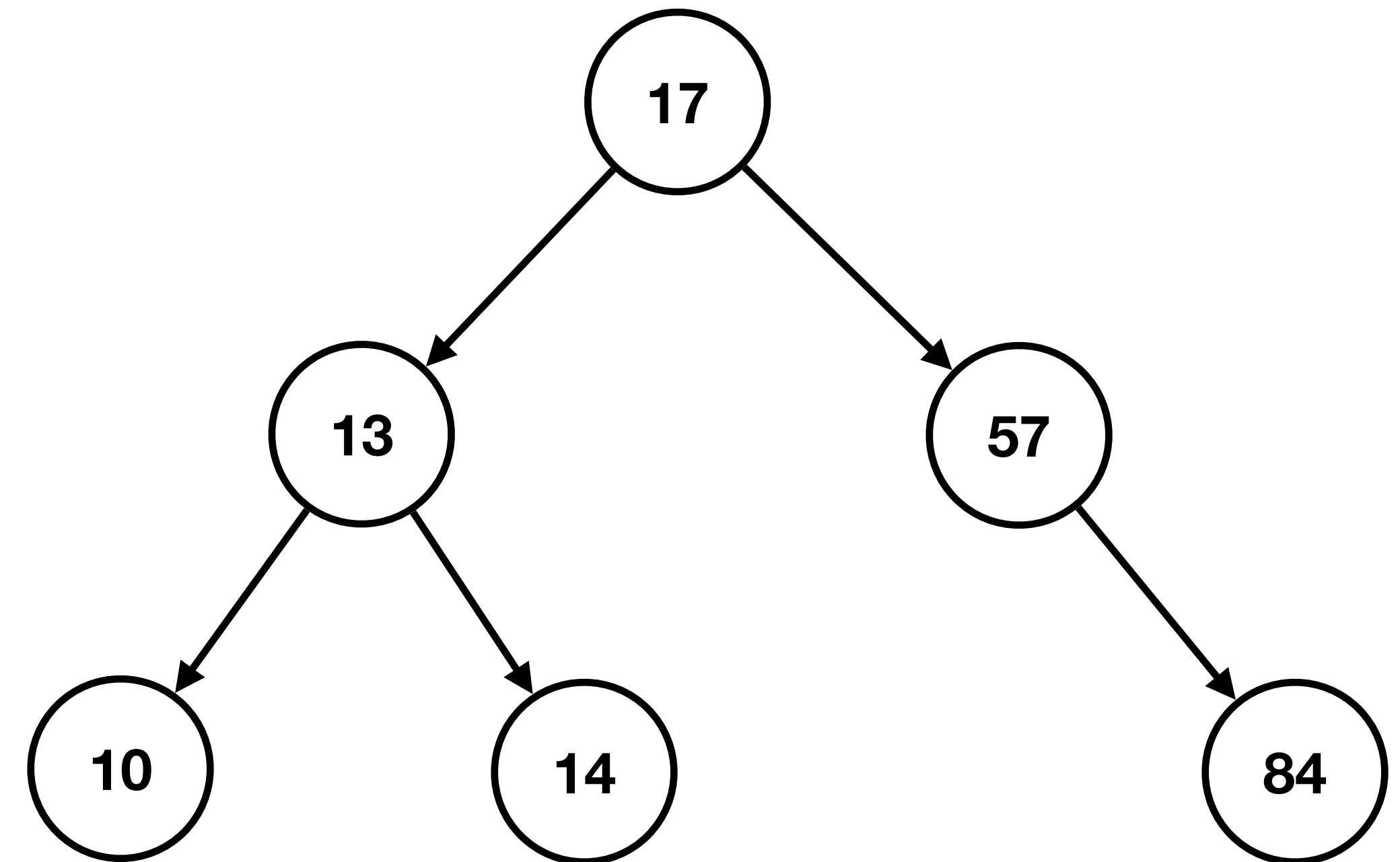
- A heap is a complete binary tree.
 - A binary tree is complete if and only if:
 - Each level is full, except possibly the last level;
 - The last level is filled from left to right

Heap

Shape property



Complete



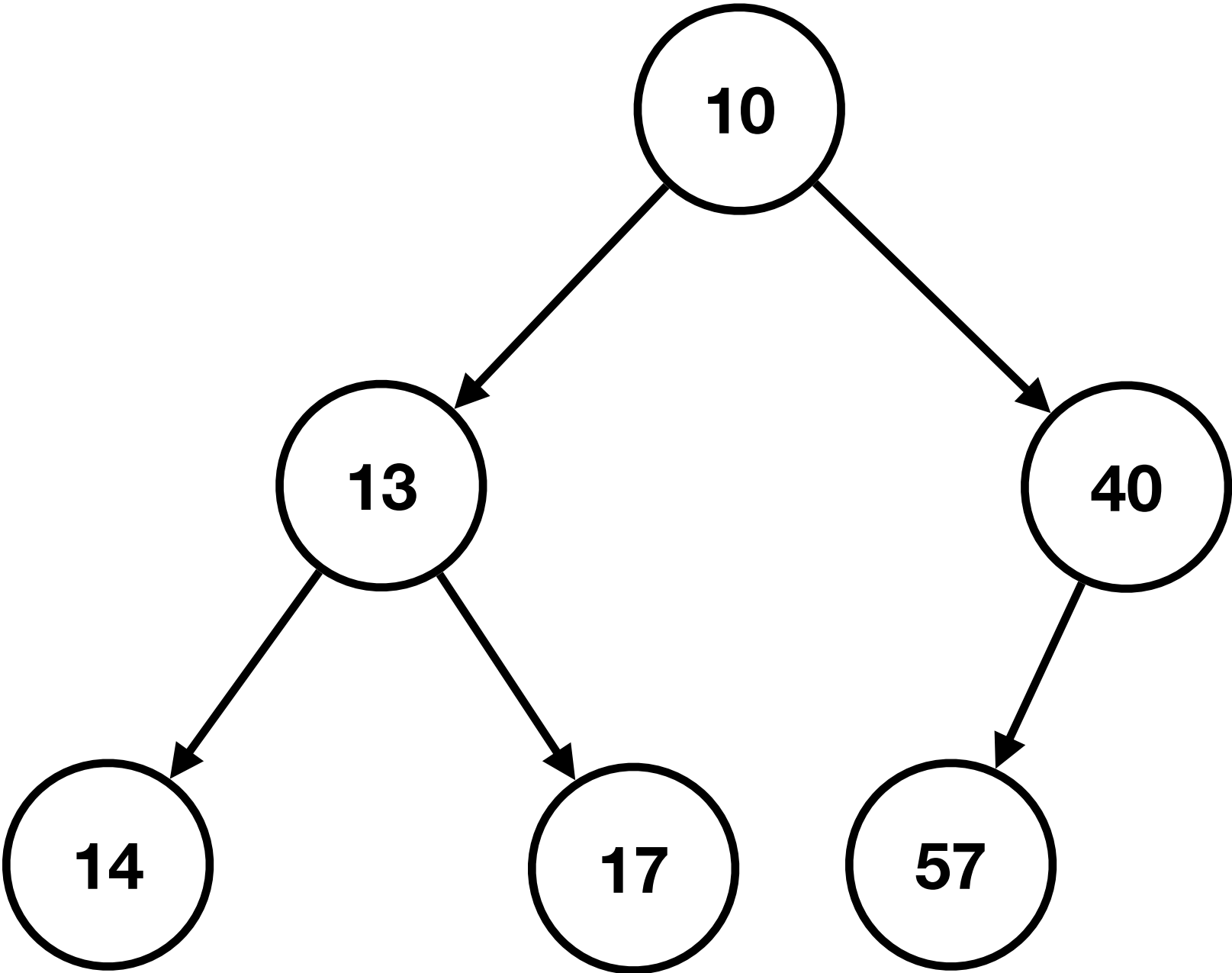
Incomplete

Heap

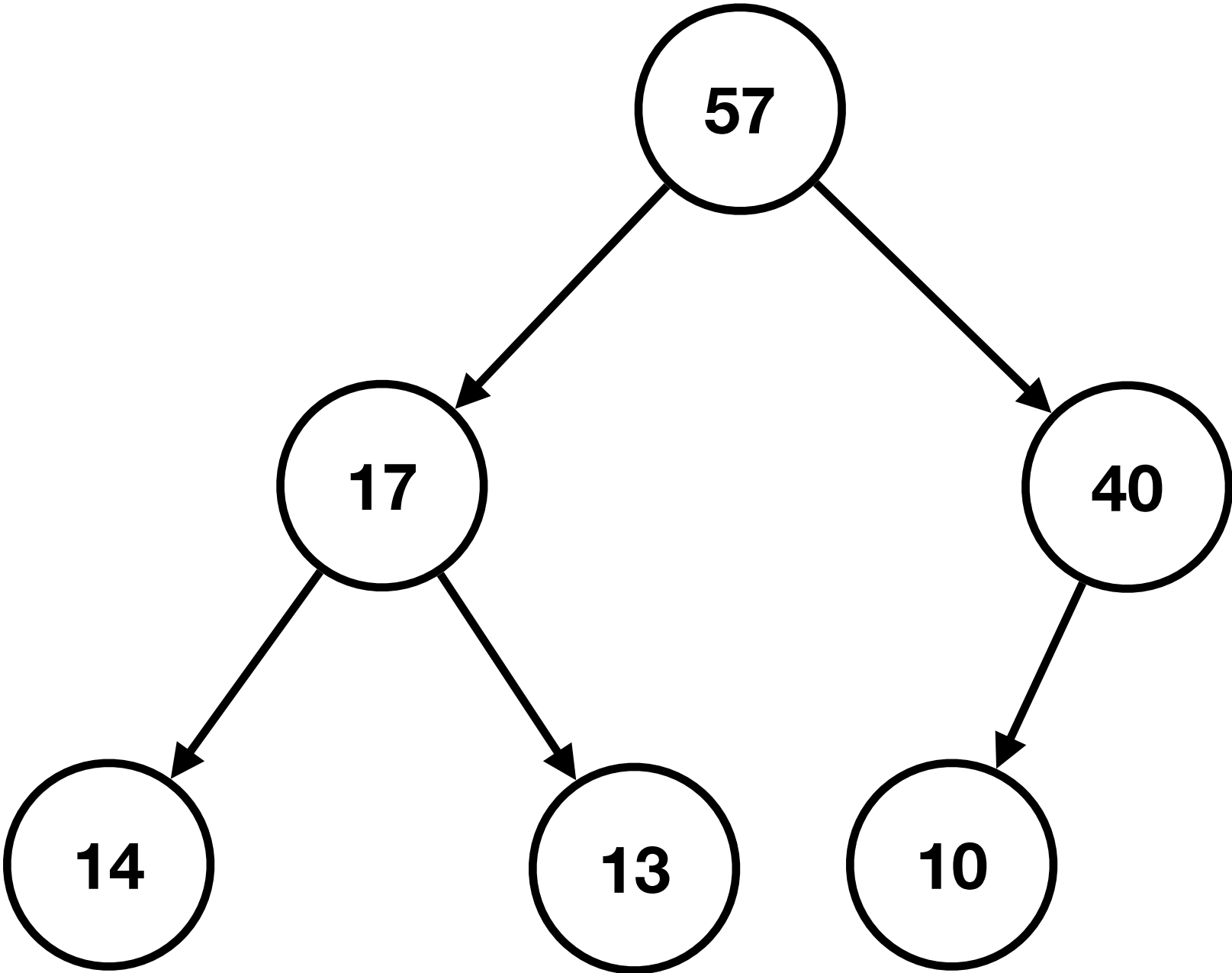
Value Property

- In a heap:
 - Parents have *higher priority* than their children: (two flavors)
 - *Min-heap*: parent value is less than any child value.
 - *Max-heap*: parent value is greater than any child value. (We use this flavor in this class)
 - Order between children does not matter.
- *This is not a BST.*

Heap

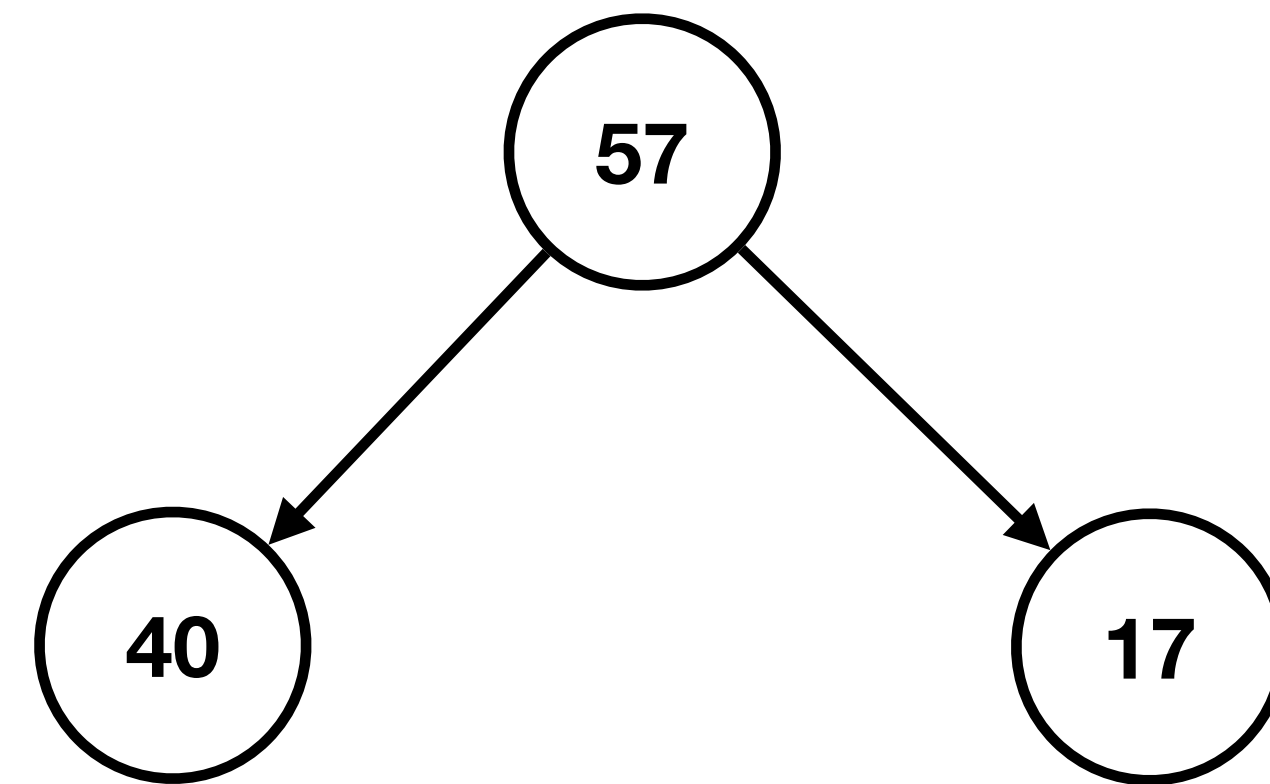
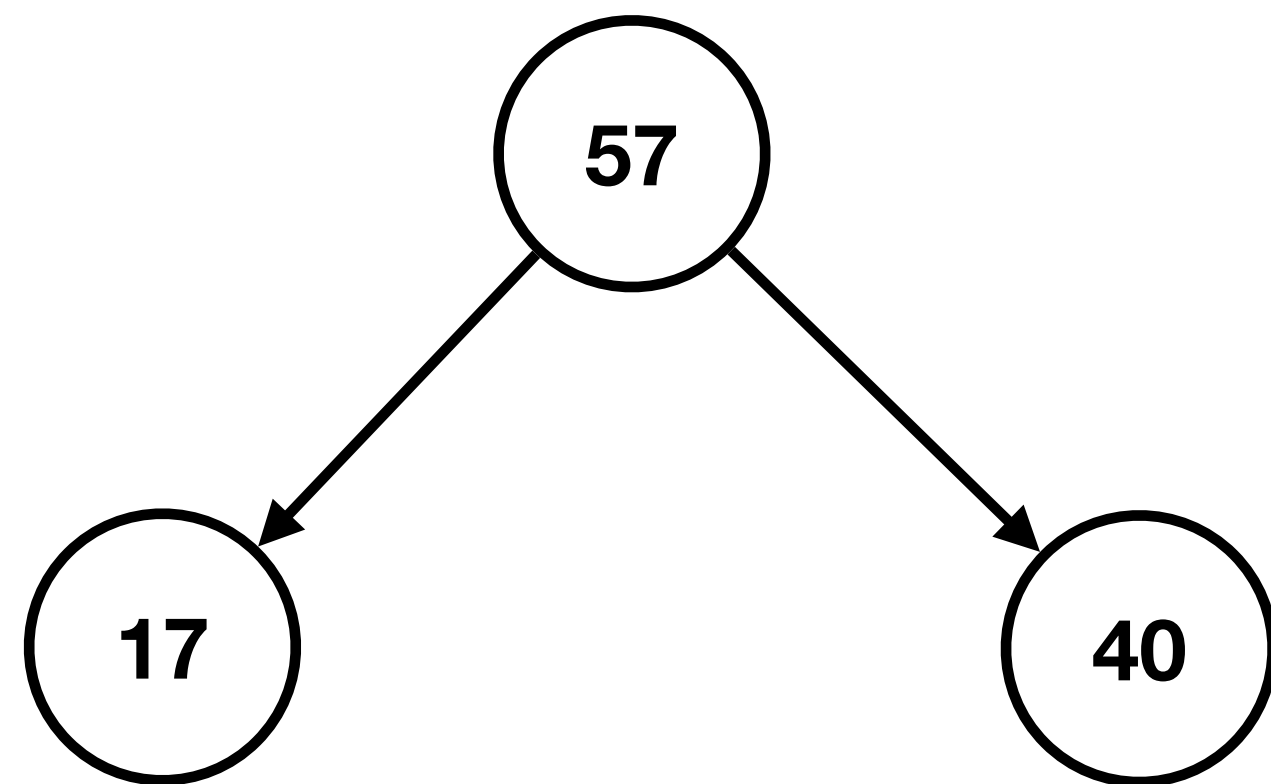


Min-heap



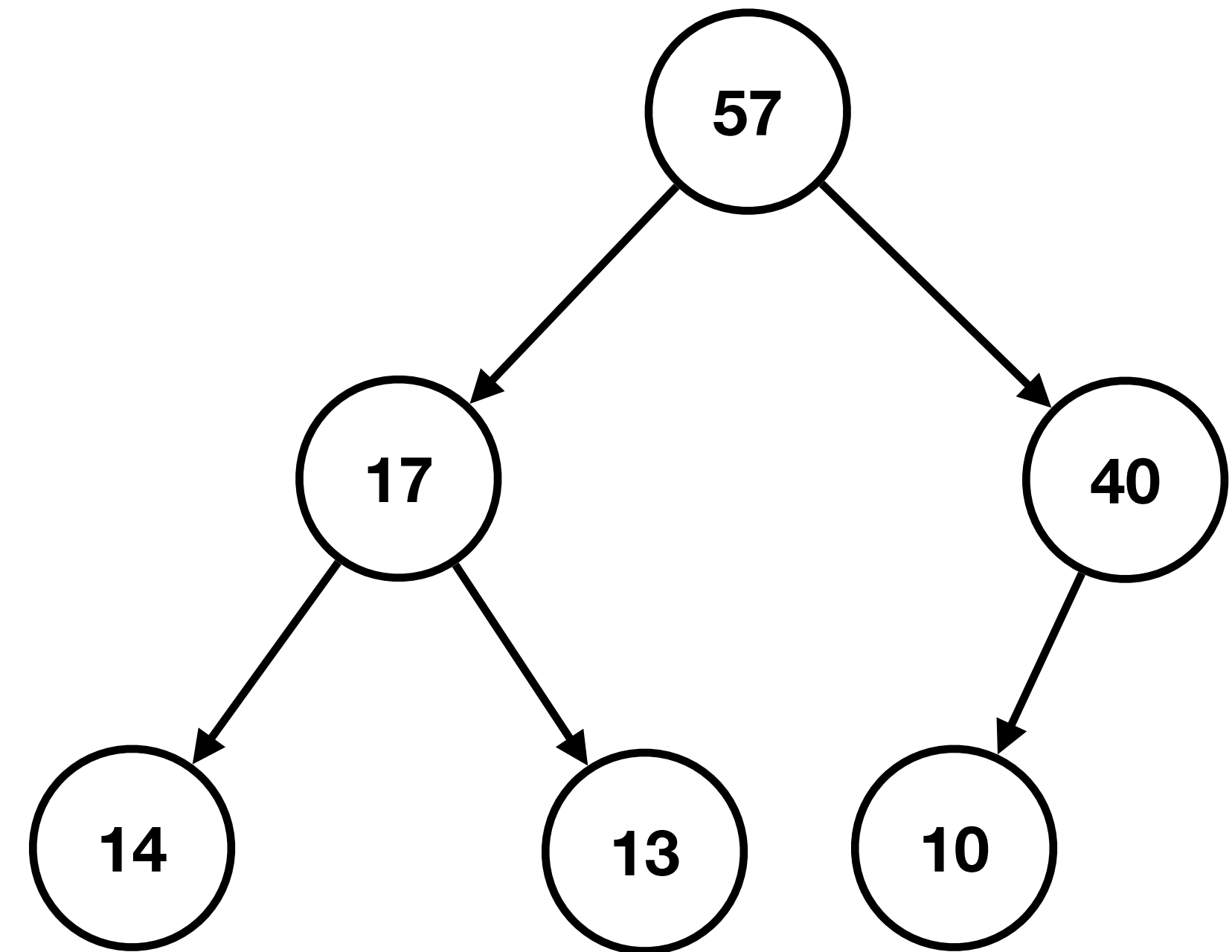
Max-heap

Heap



- *Not a BST because:*
 - Parents is greater than both children.
 - No guaranteed ordering between children.

Heap

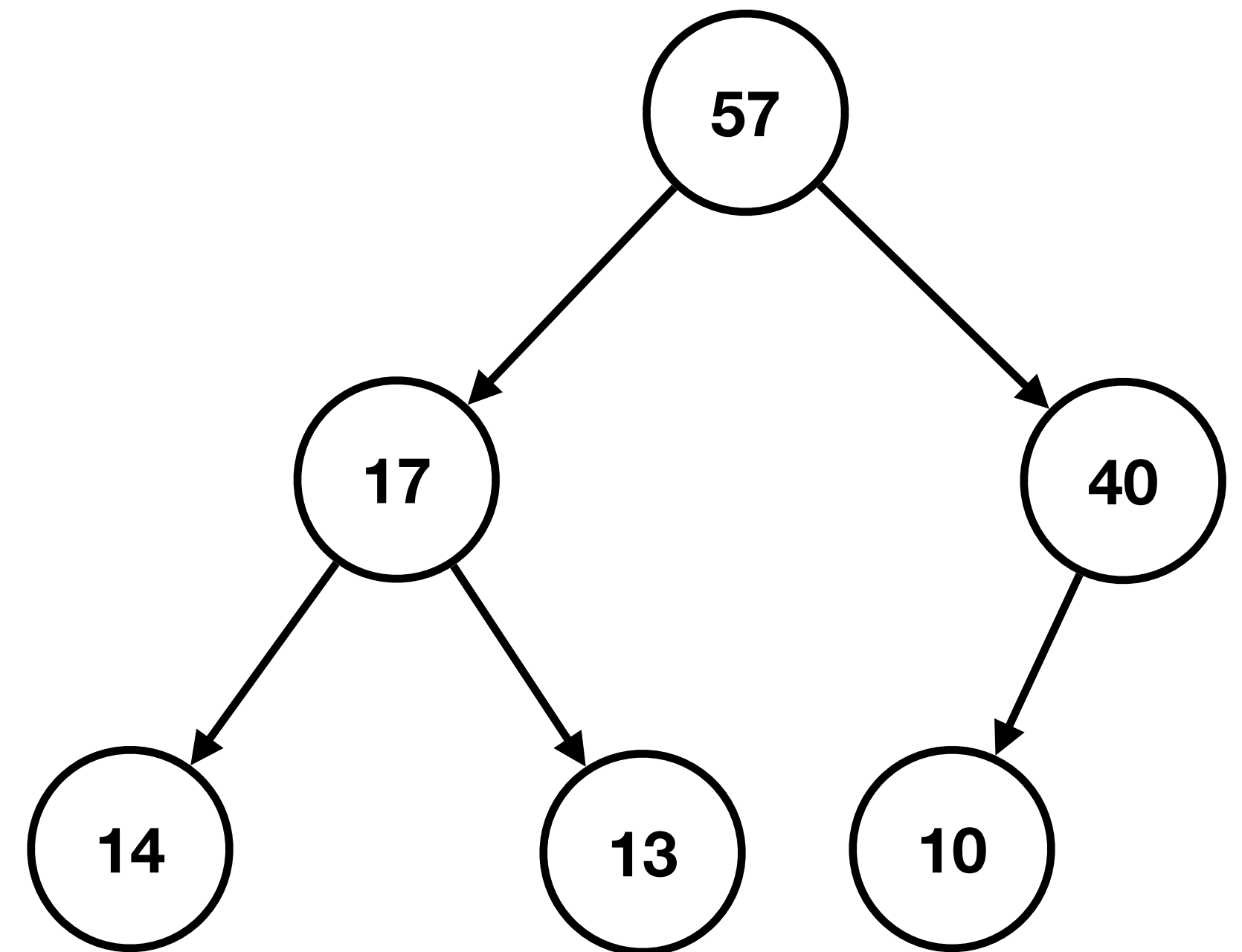


- Being complete means every 6-element heap has this shape.
- If a 7th element is added, the new trees will always have the same shape.

Heap

What is the best way to store this?

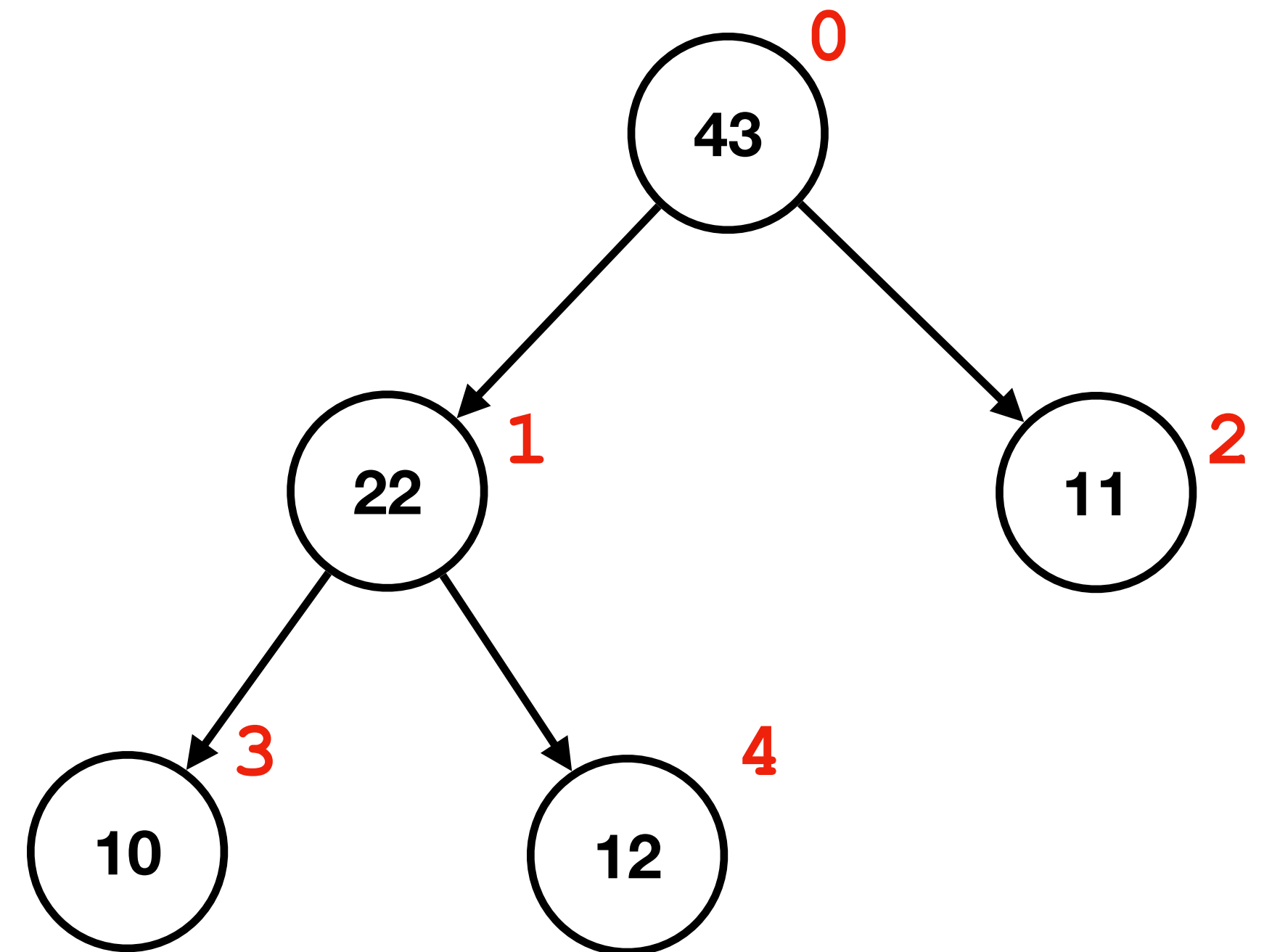
- Could use nodes and pointers...
- Or, we can use a data structure that provides constant-time access to elements:
- array



Heap

What is the best way to store this?

- Being complete means we can store the elements row by row.

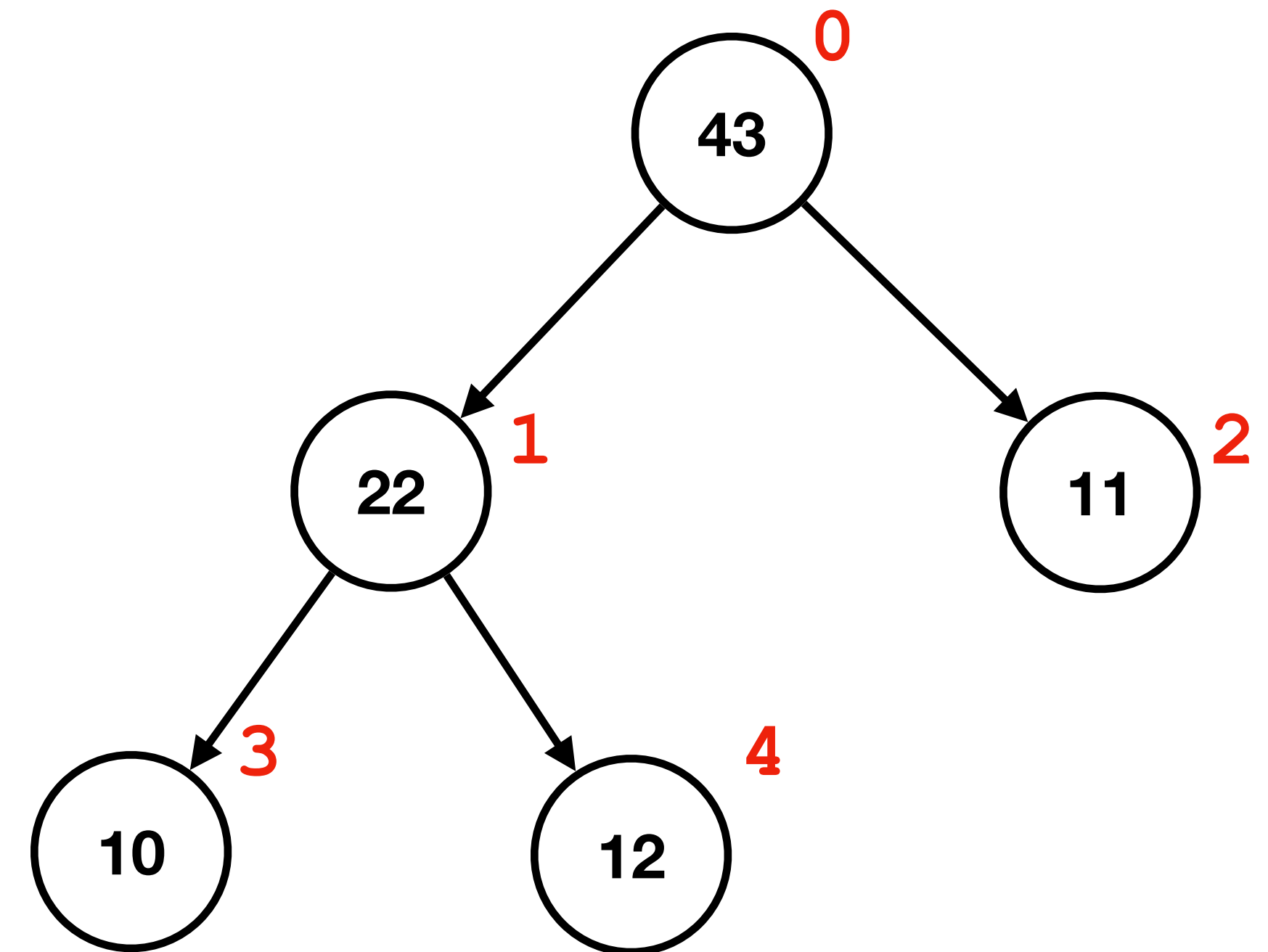


[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]	[10]
43	22	11	10	12						

Heap

What is the best way to store this?

- Root at index 0
- For an element at position i :
 - left child: $2i + 1$
 - right child: $2i + 2$
 - parent: $\lfloor (i - 1)/2 \rfloor$



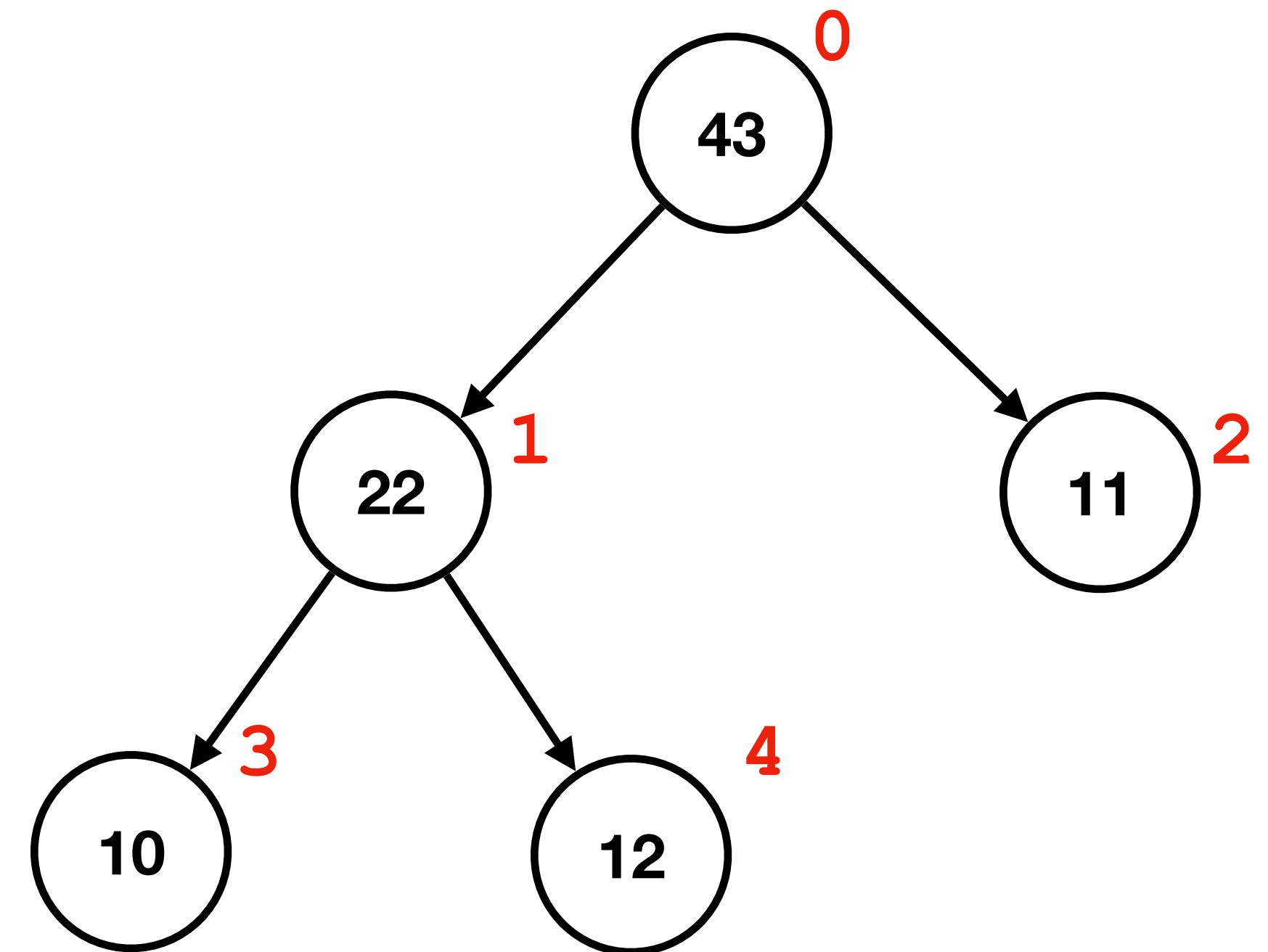
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Heap

What is the best way to store this?

- For an element at position i :
 - left child: $2i + 1$
 - right child: $2i + 2$
 - parent: $\lfloor (i - 1) / 2 \rfloor$

```
int self = heap[i];  
int left_child = heap[2 * i + 1];  
int right_child = heap[2 * i + 2];  
int parent = heap[(i - 1) / 2];
```

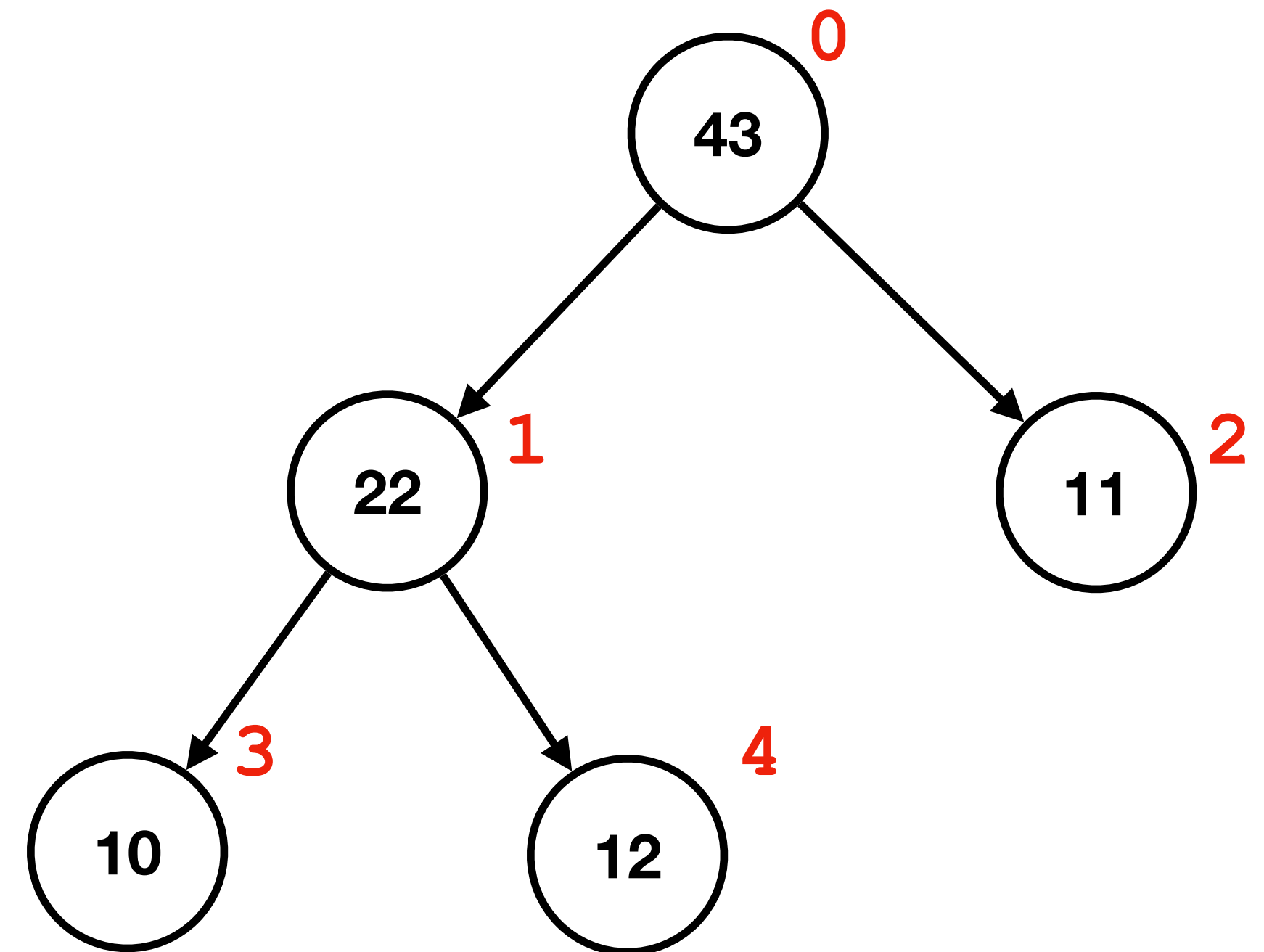


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Heap

What is the best way to store this?

- Possible exam questions:
 - Given tree, write array
 - Given array, draw tree
 - Identify parent, left, right children

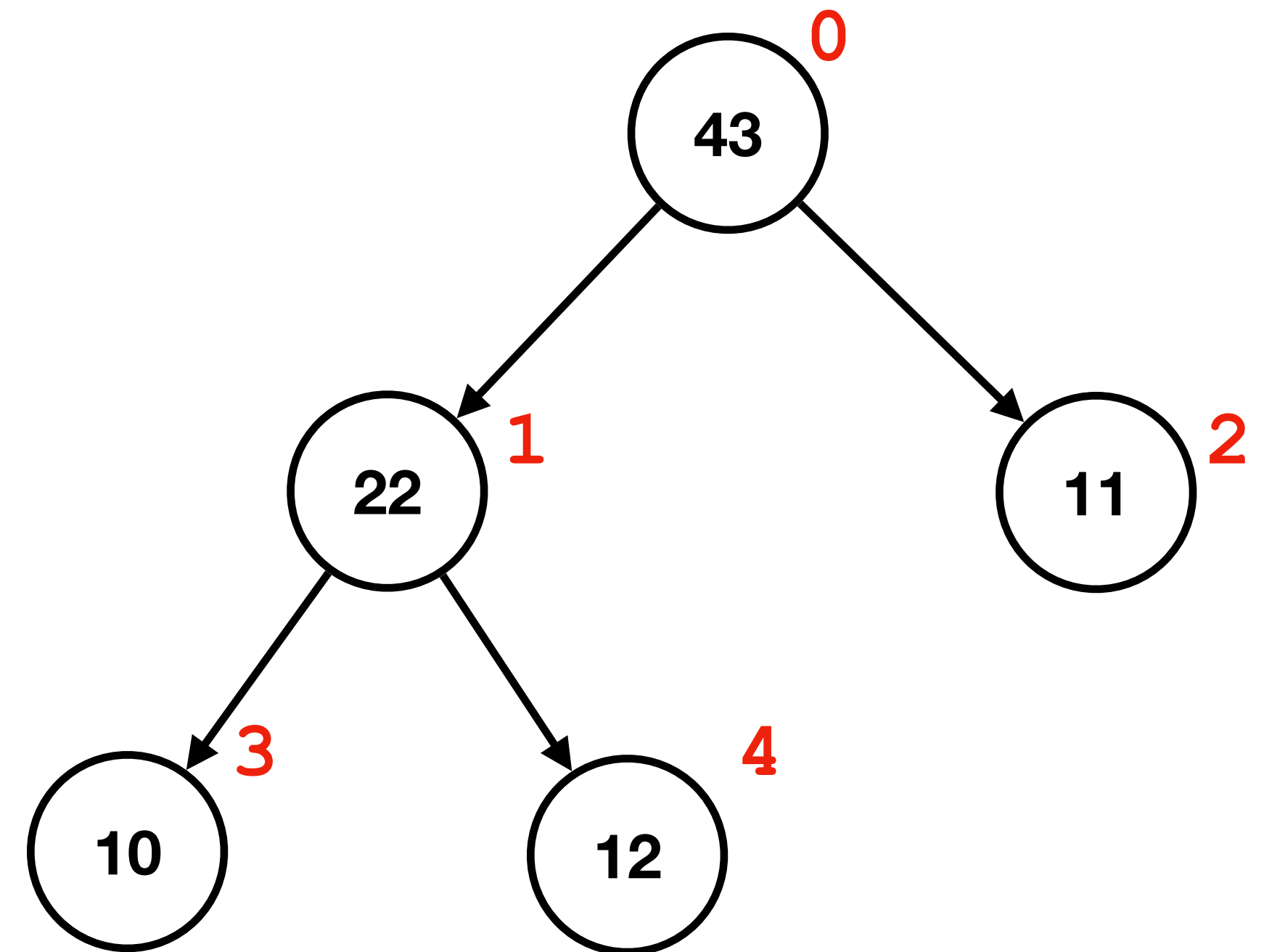


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Heap

Operations

- `get_top()`
- $O(1)$ operation: `h[0]`
- How about insertion and removal?

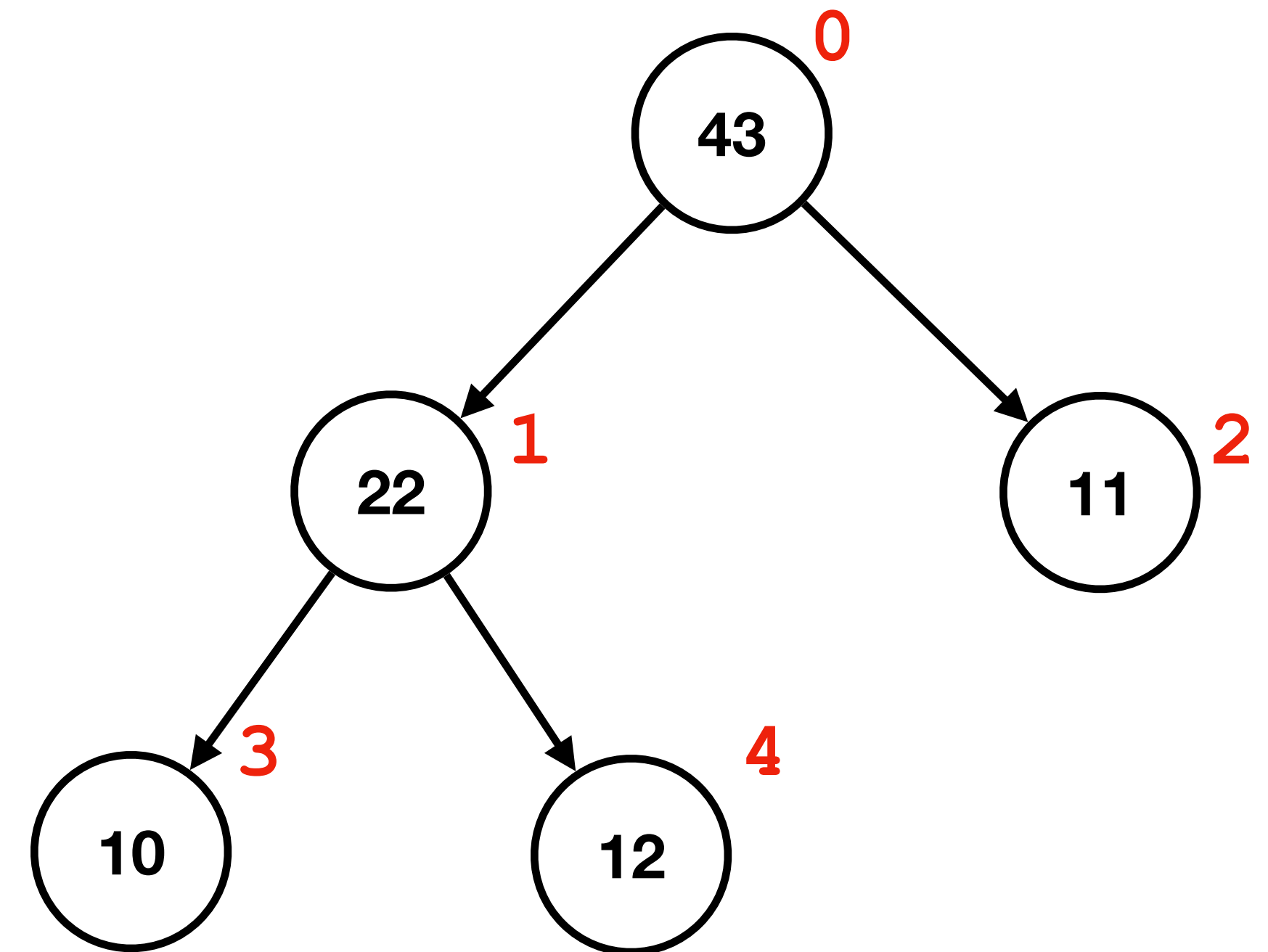


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Heap

Operations

- Insertion and removal scheme:
 1. Restore shape property first, ignoring value property
 2. Restore value property without changing the shape

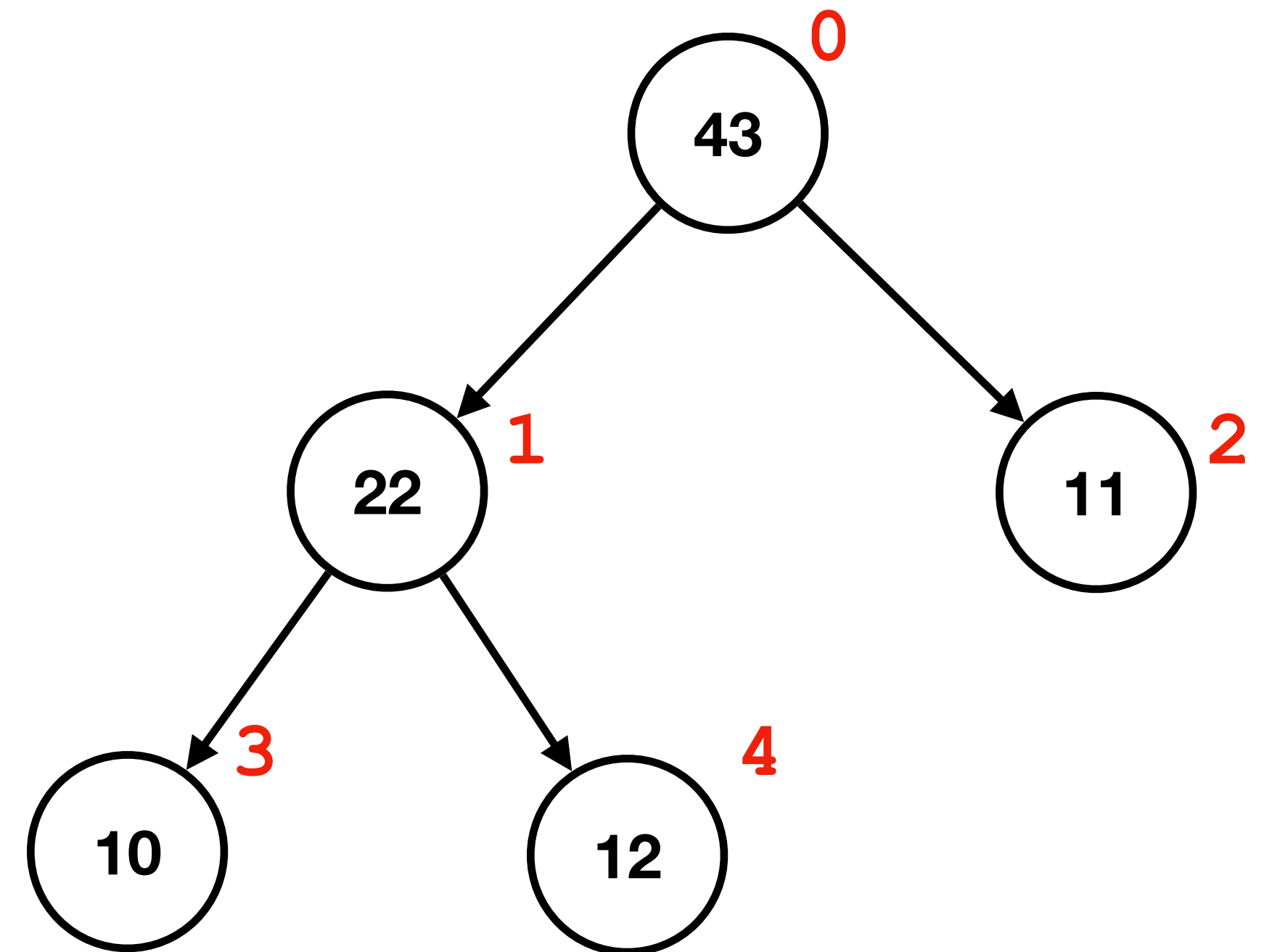


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Heap

Operations

- `insert(50)`
- Where should we put the element to maintain the *shape* property?

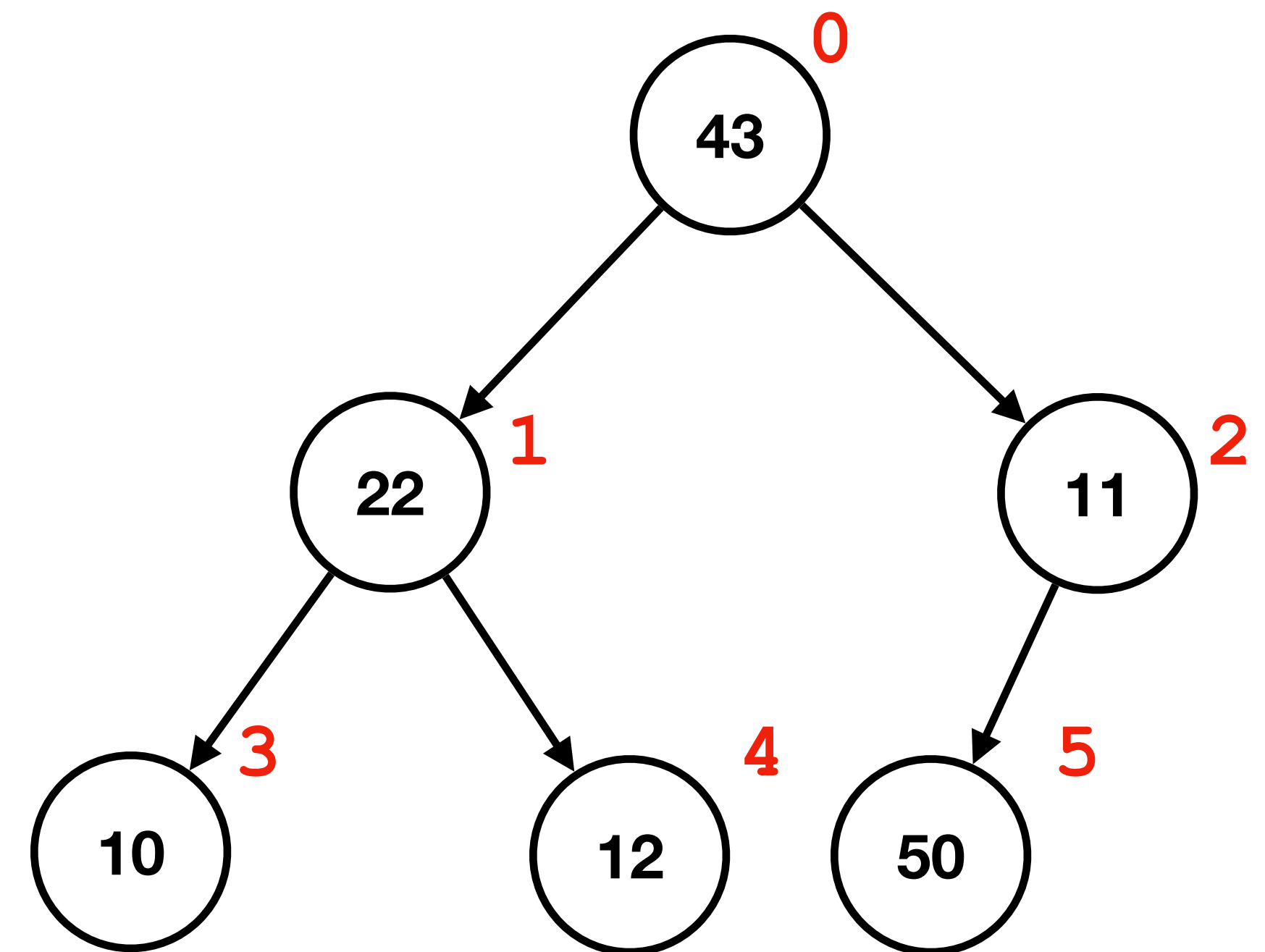


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Heap

Operations

- `insert(50)`
 - Where should we put the element to maintain the shape property?
1. Insert item at element `h[heap_size + 1]`
(very likely destroying the heap property)
 2. Increment heap size
 3. Bubble up until you get to root:
 - Swap with its parent if in incorrect order

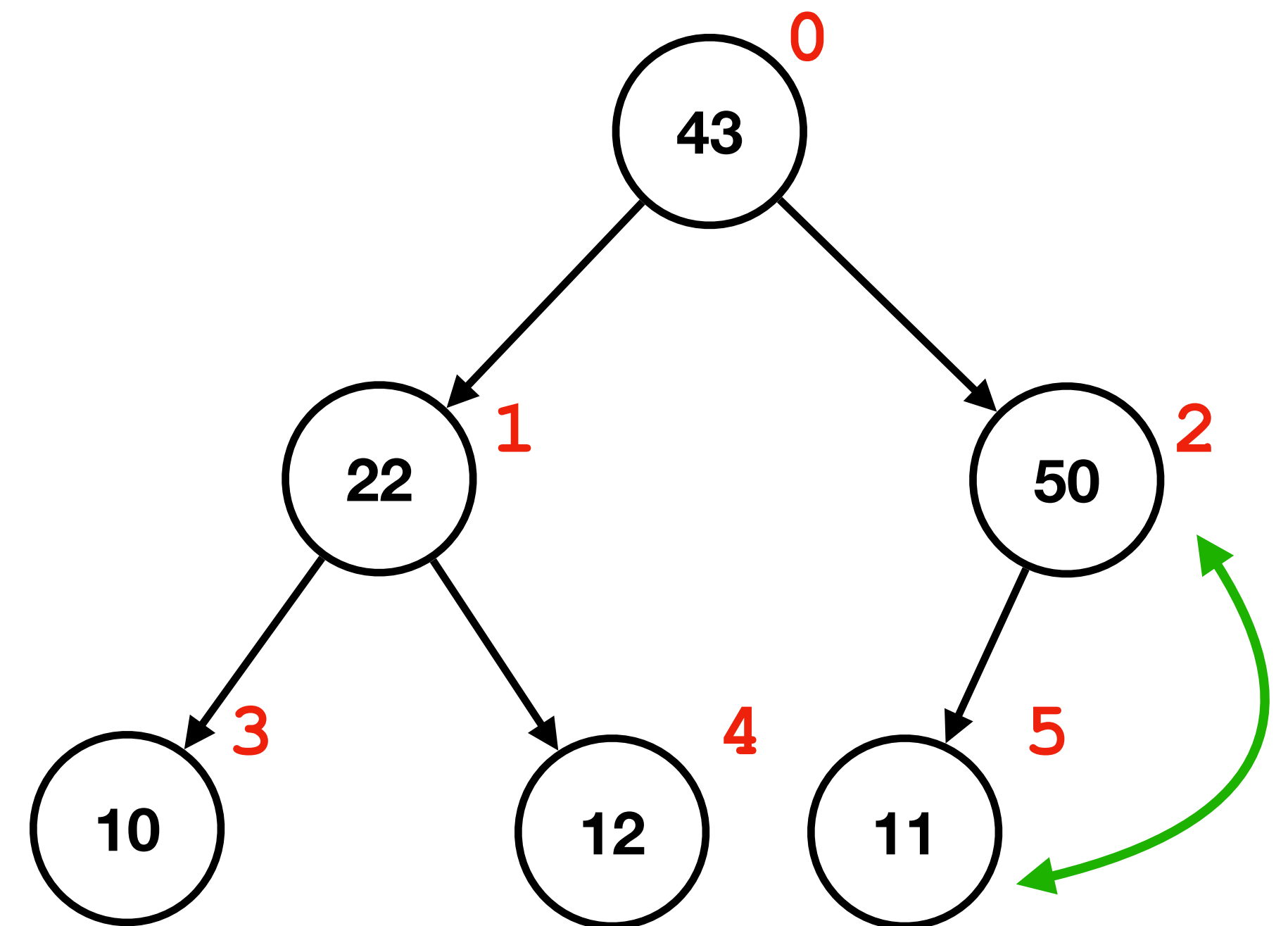


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43	22	11	10	12	50					

Heap

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- `insert(50)`
 - Where should we put the element to maintain the *shape* property?
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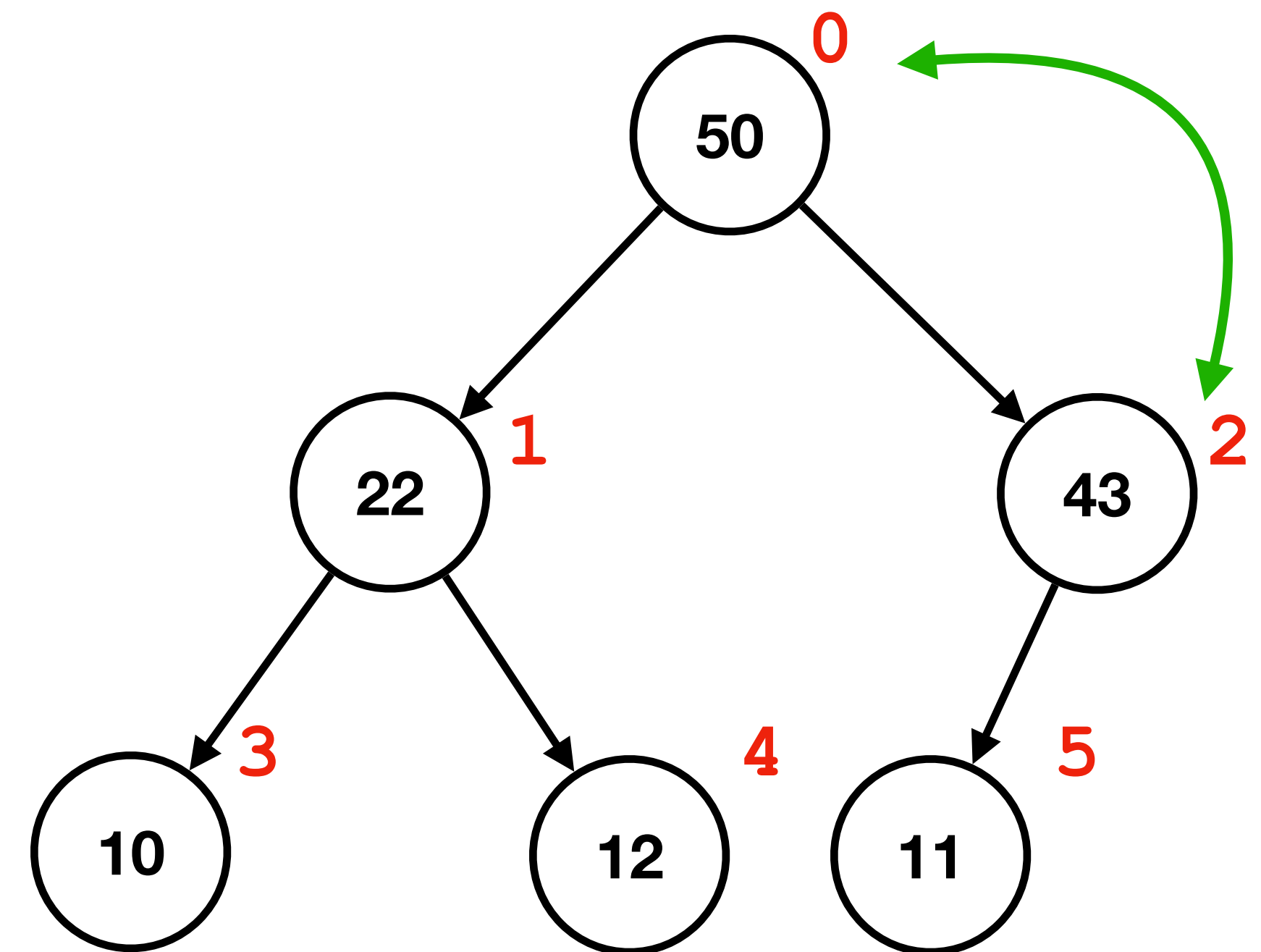


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Heap

Operations

- `insert(50)`
 - Where should we put the element to maintain the *shape* property?
1. Insert item at element `h[heap_size + 1]`
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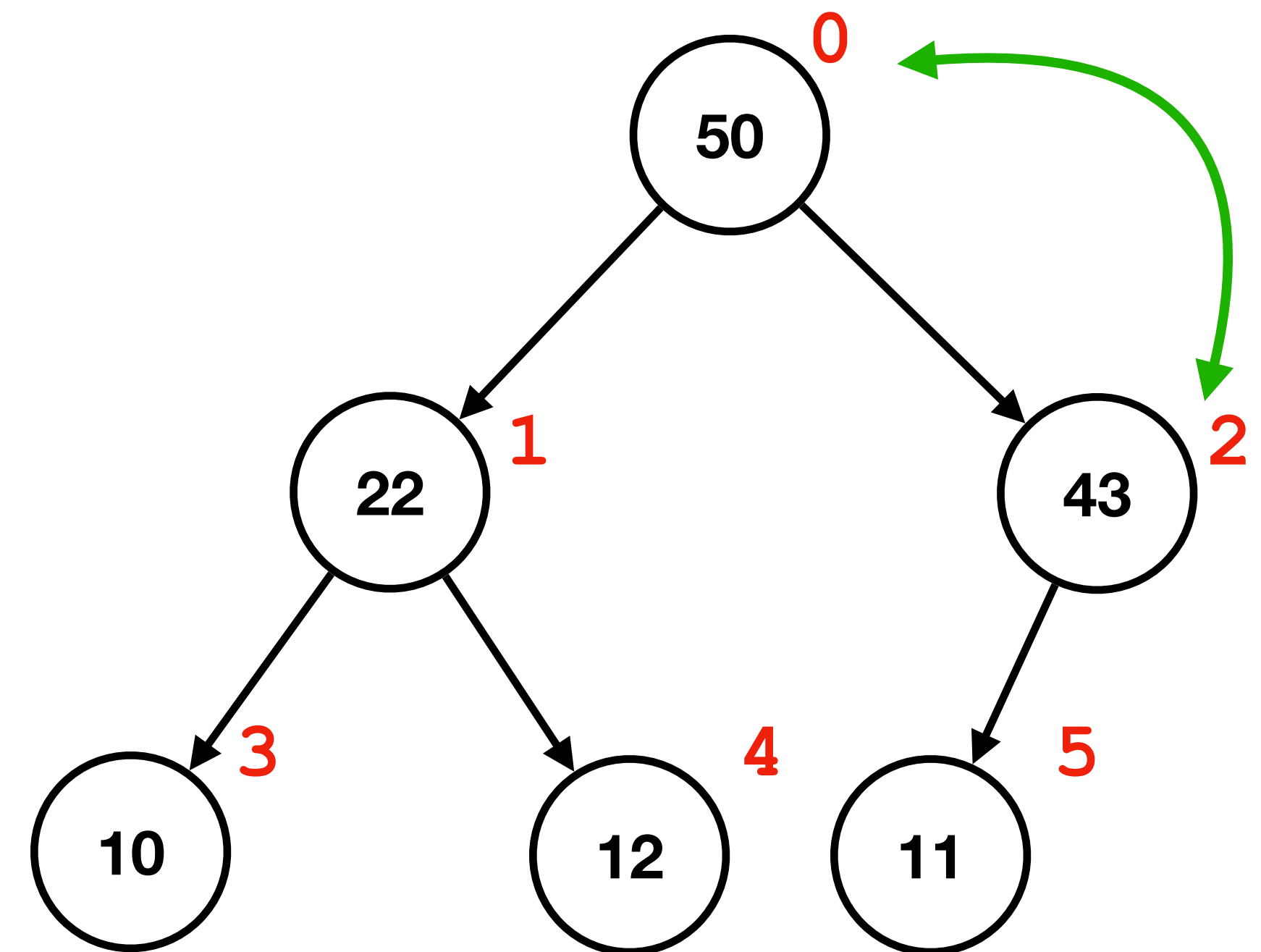


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Heap

Operations

- `insert(50)`
 - Worst case complexity: $O(\log n)$
1. Insert item at element `h[heap_size + 1]`
(very likely destroying the heap property)
 2. Increment heap size
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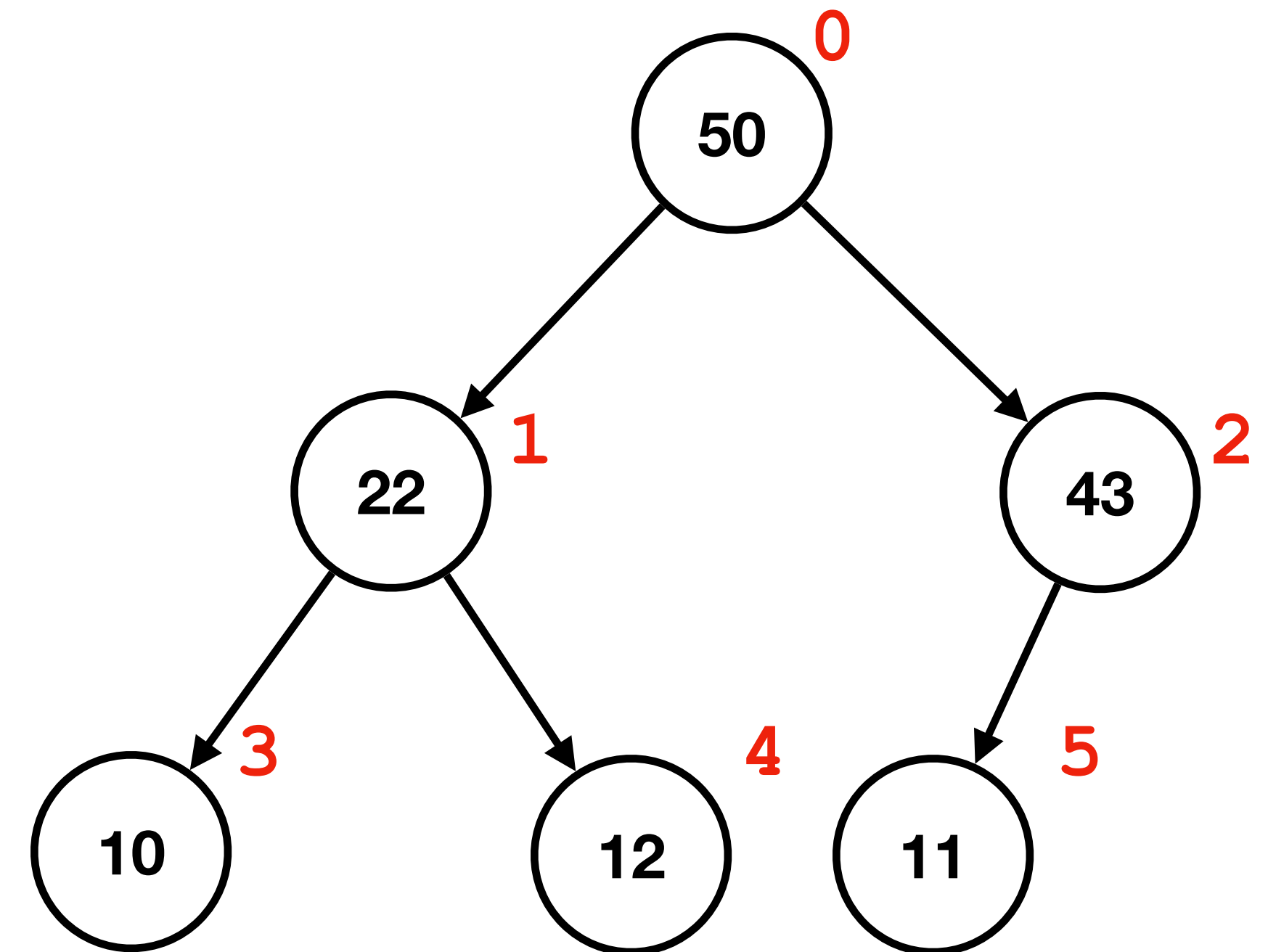
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Heap

Operations

- `remove_top()`

1. Remove root (save for later return)



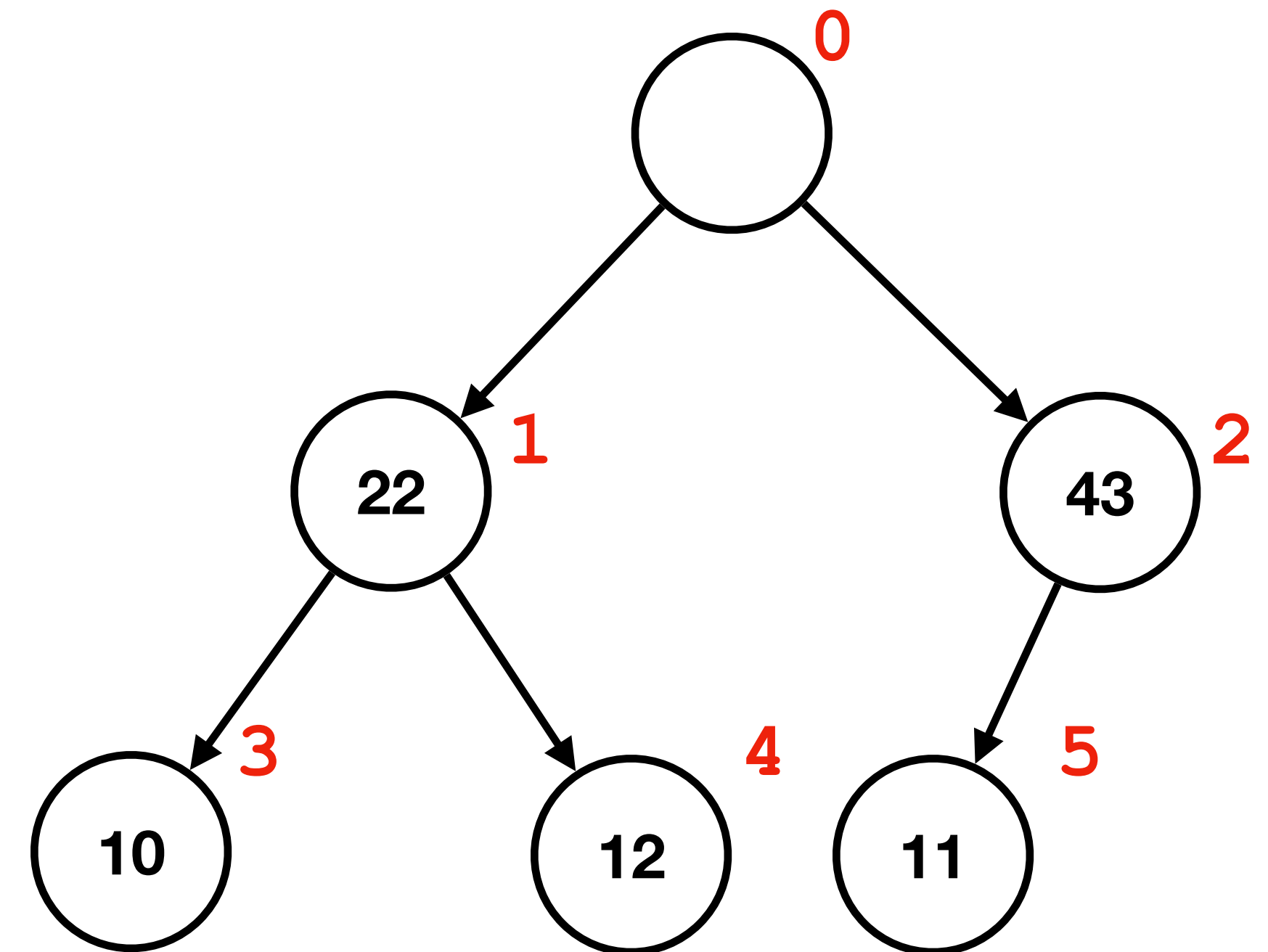
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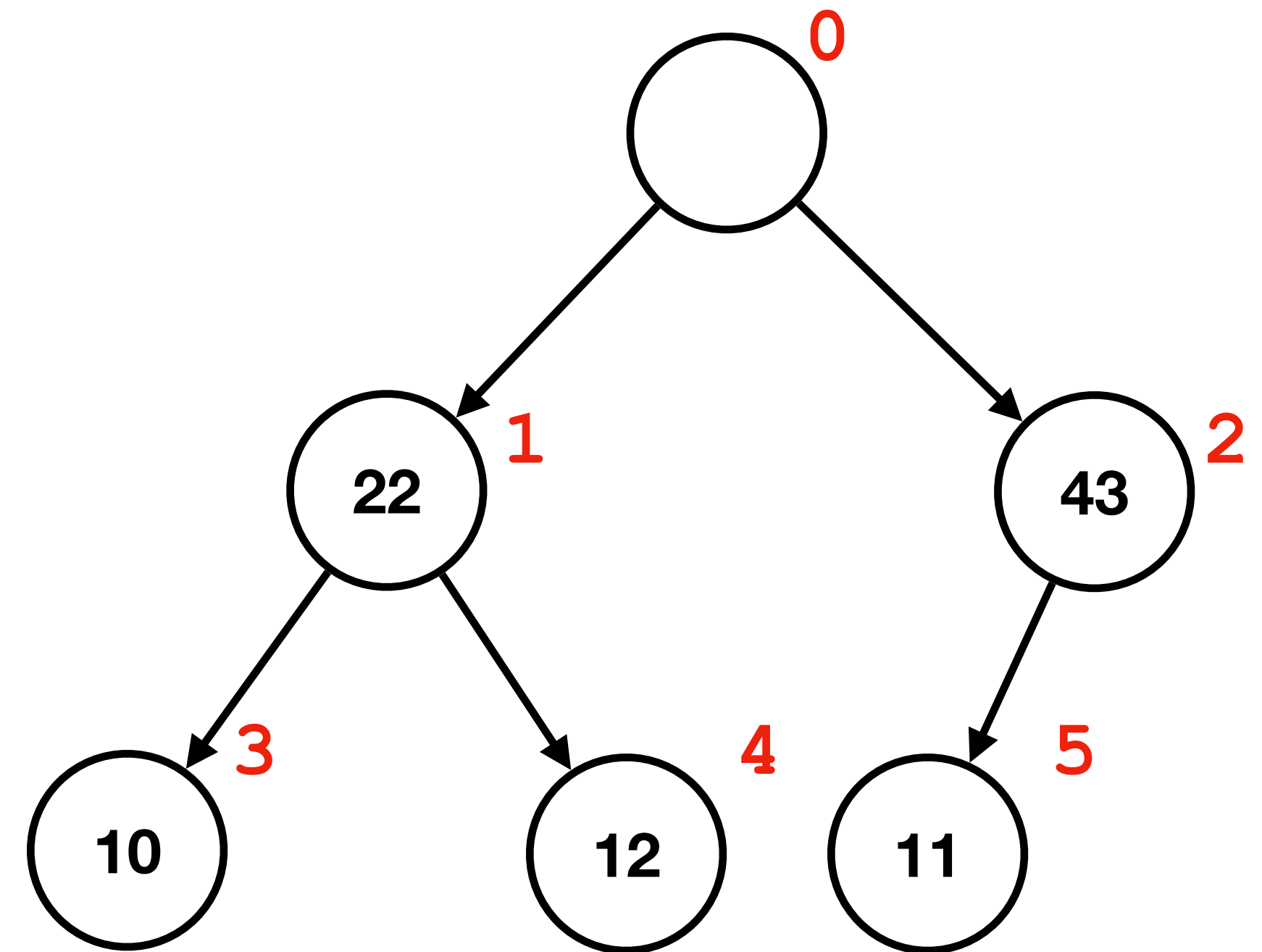


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Heap

Operations

- `remove_top()`
1. Remove root (save for later return)
 2. Maintain shape: replace root with last element in the array

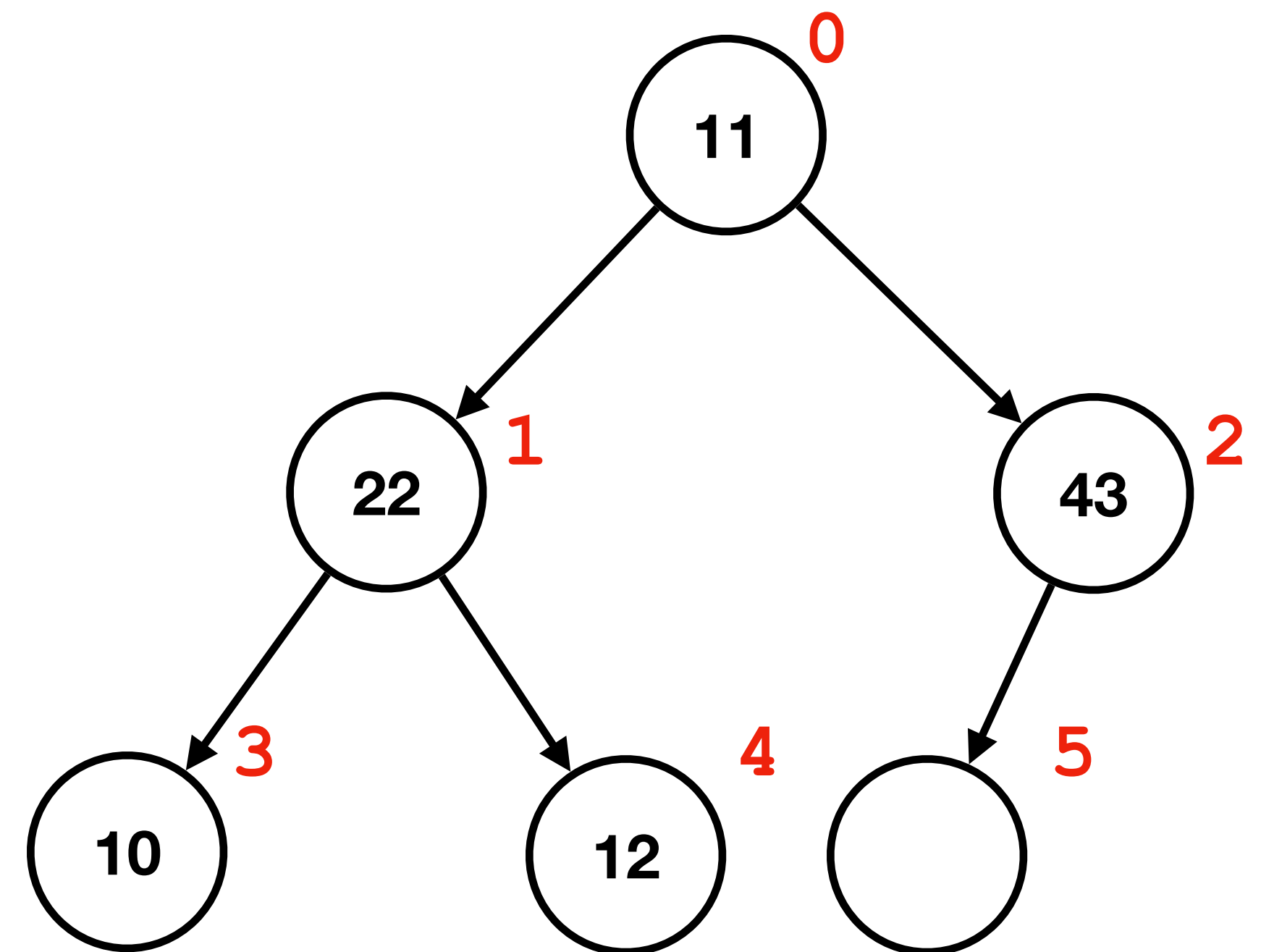


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- `remove_top()`
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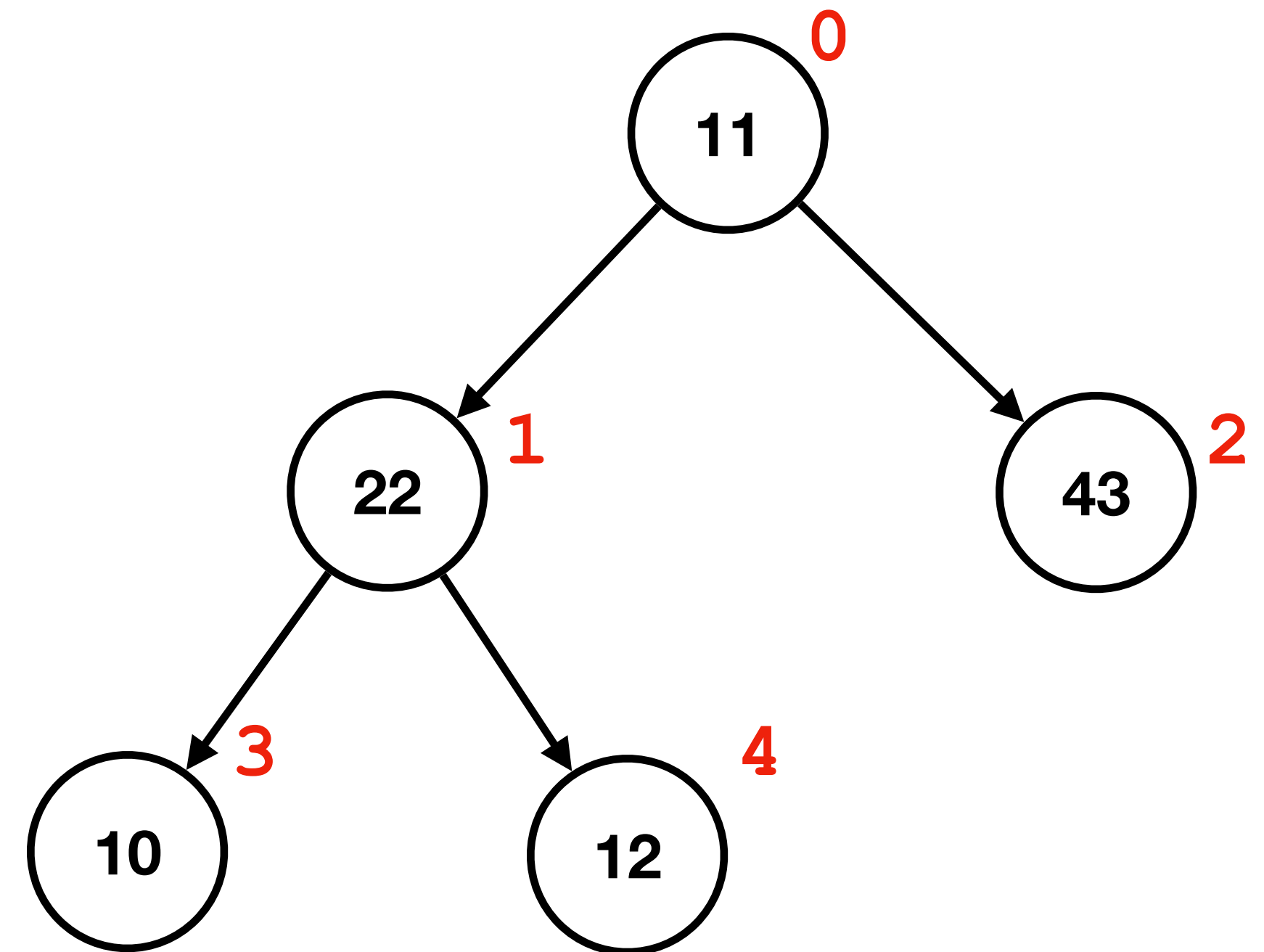


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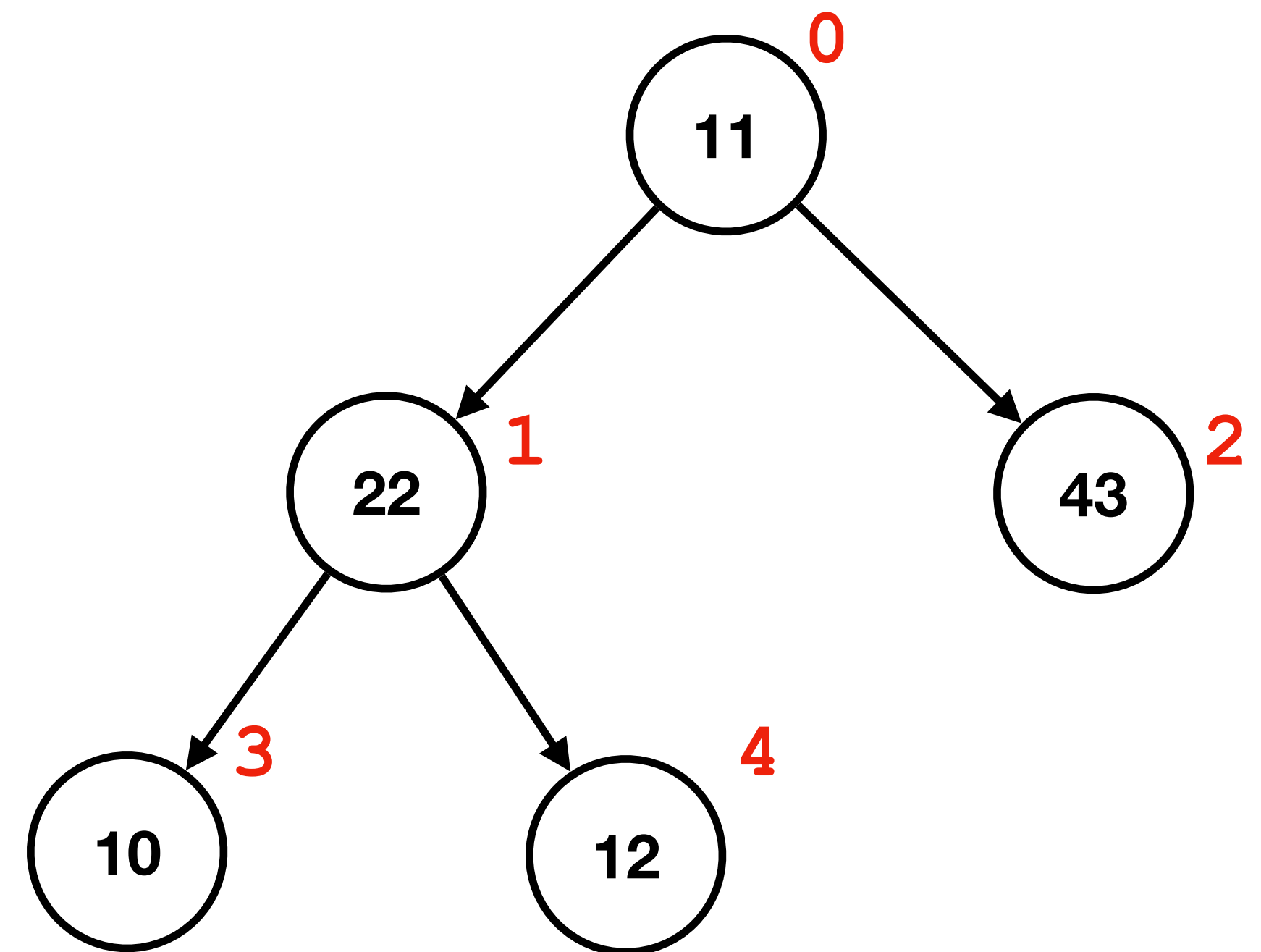


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Heap

Operations

- `remove_top()`
1. Remove root (save for later return)
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(Decrement `heap_size`)
 3. Sink down:
 1. If $\geq$ both of its children, if correct stop
 2. If not, swapped with the larger

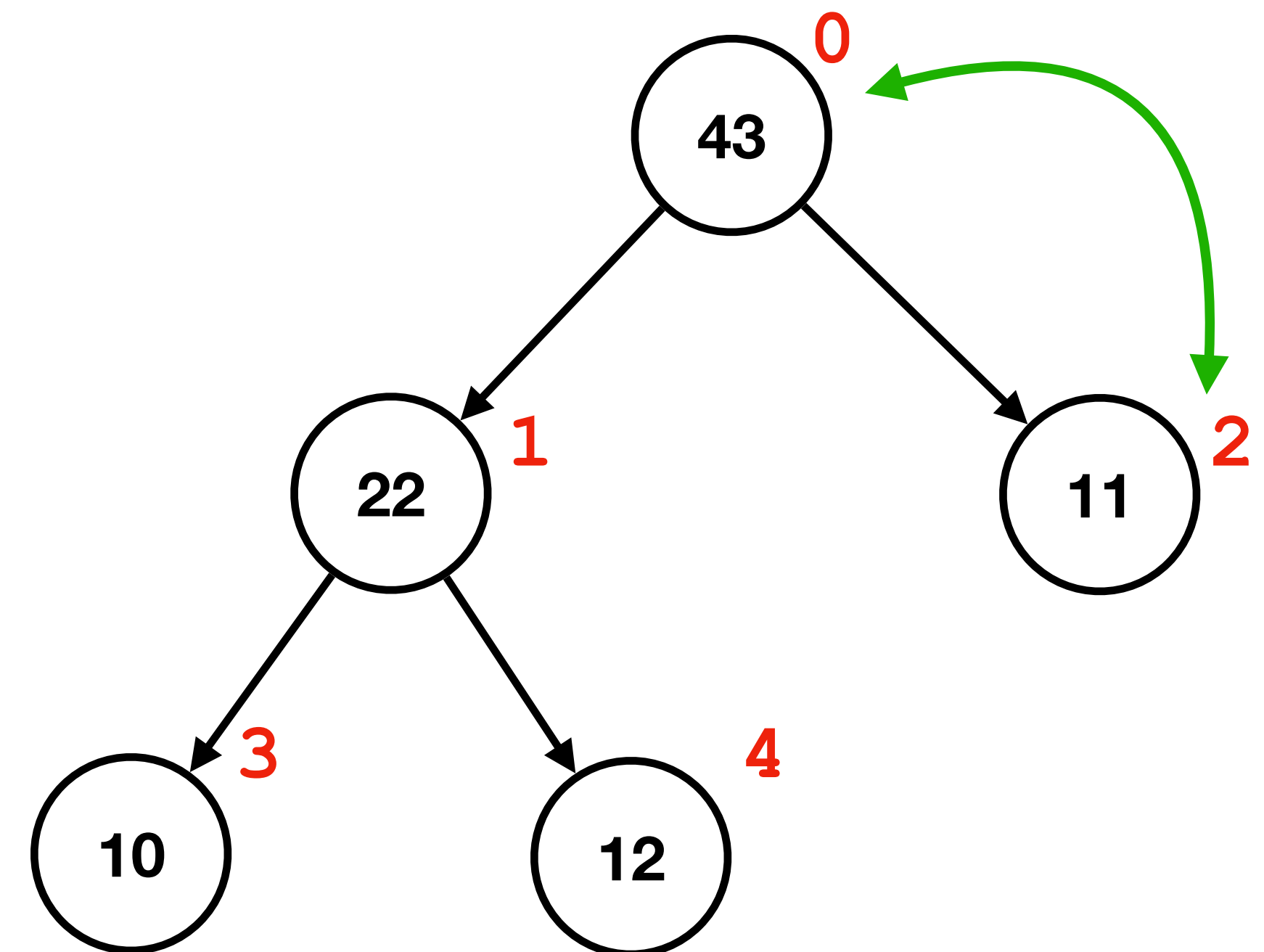


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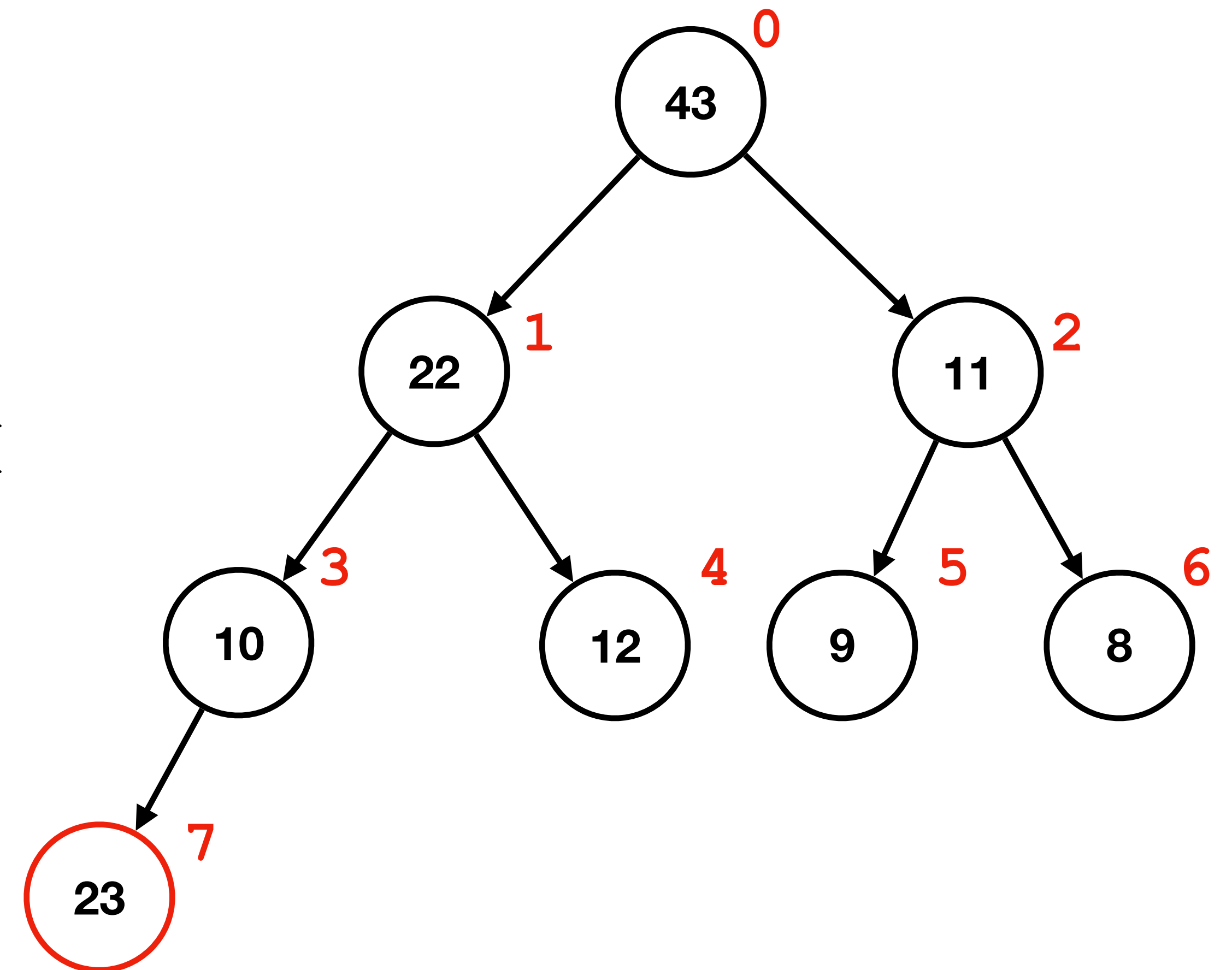
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Heap

Bubble Up

```
void bubble_up(int *arr, int i)
{
    while (i > 0) {
        int parent = (i - 1) / 2;

        if (arr[parent] < arr[i]) {
            swap(arr, parent, i);
            i = parent;
        } else {
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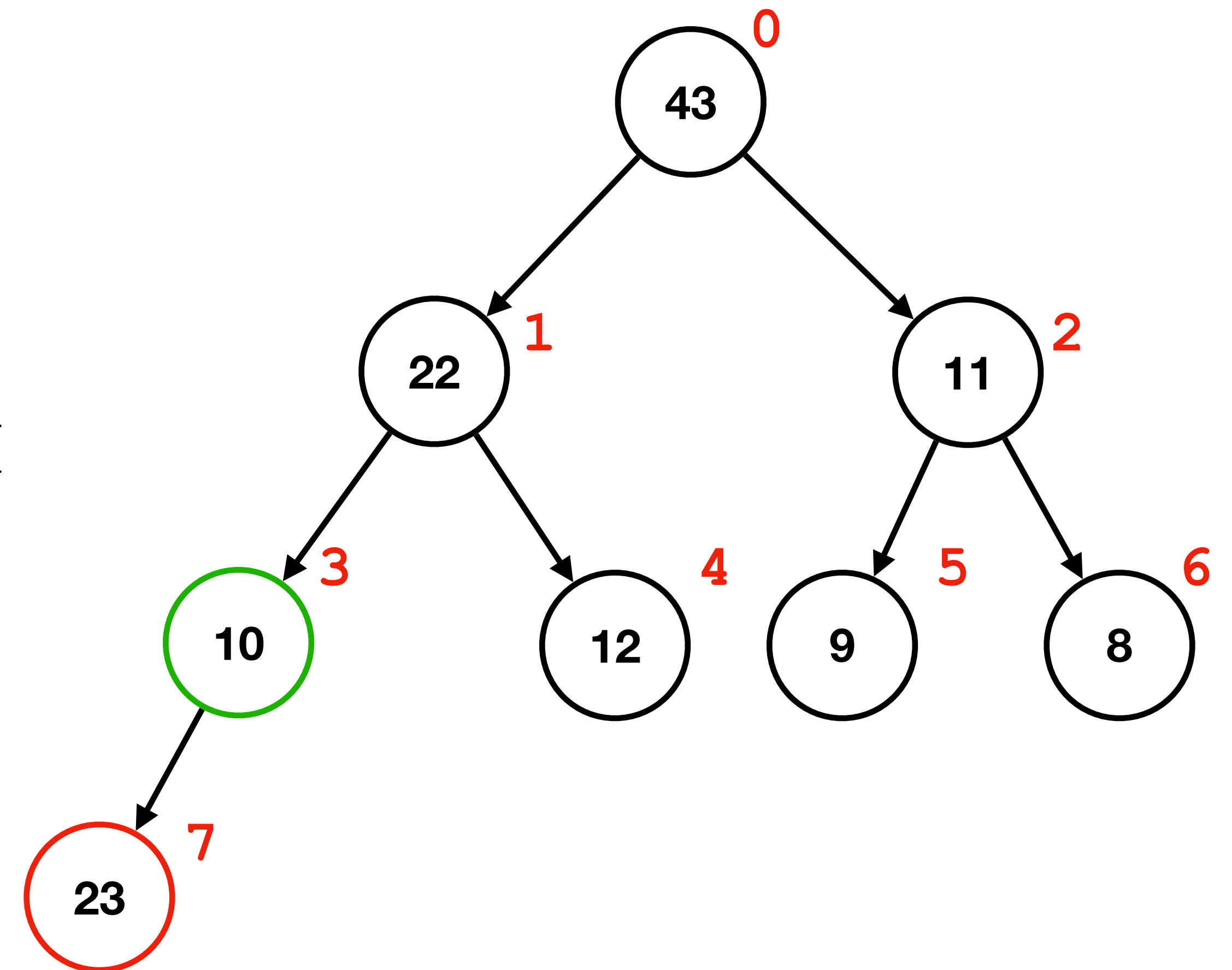
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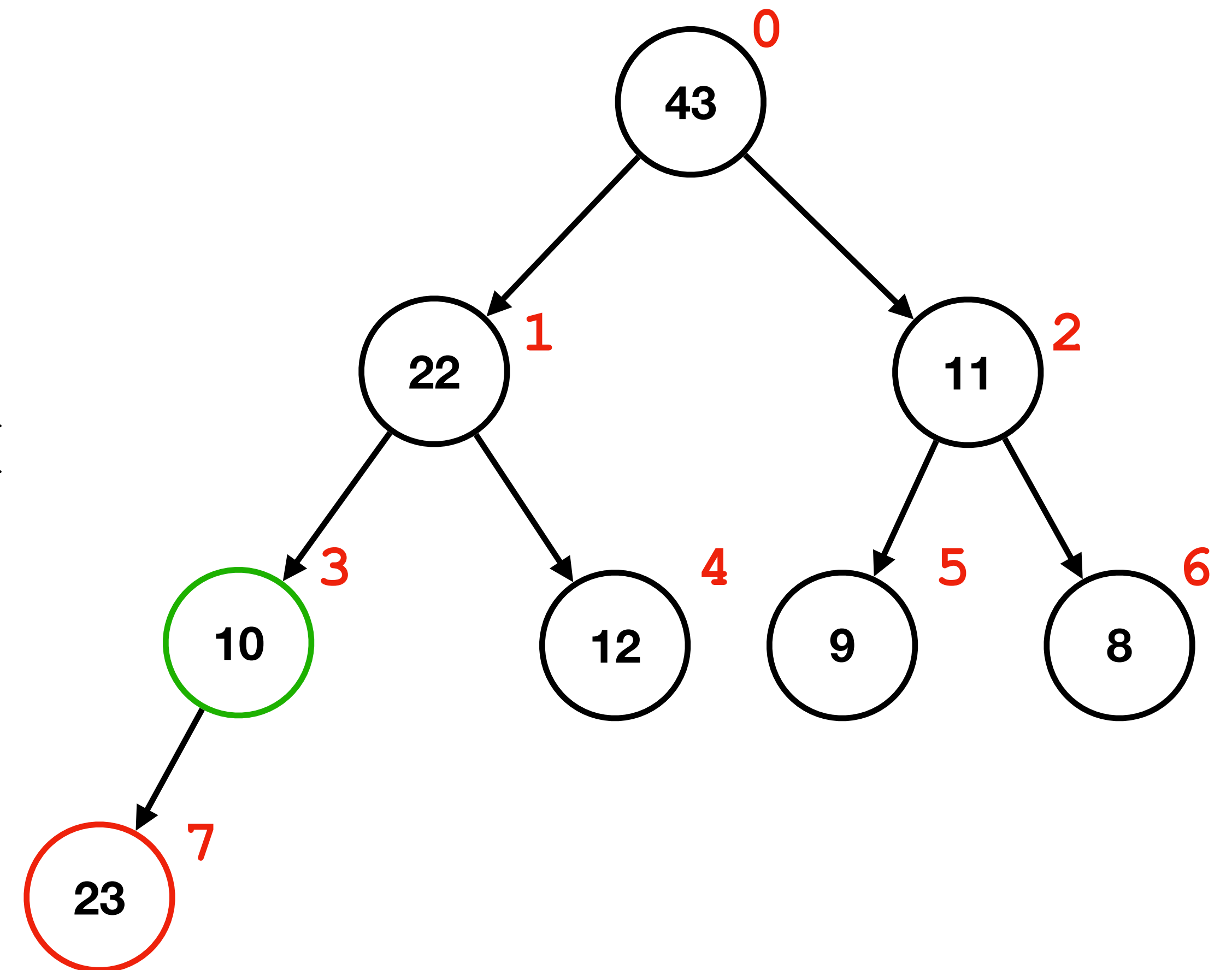
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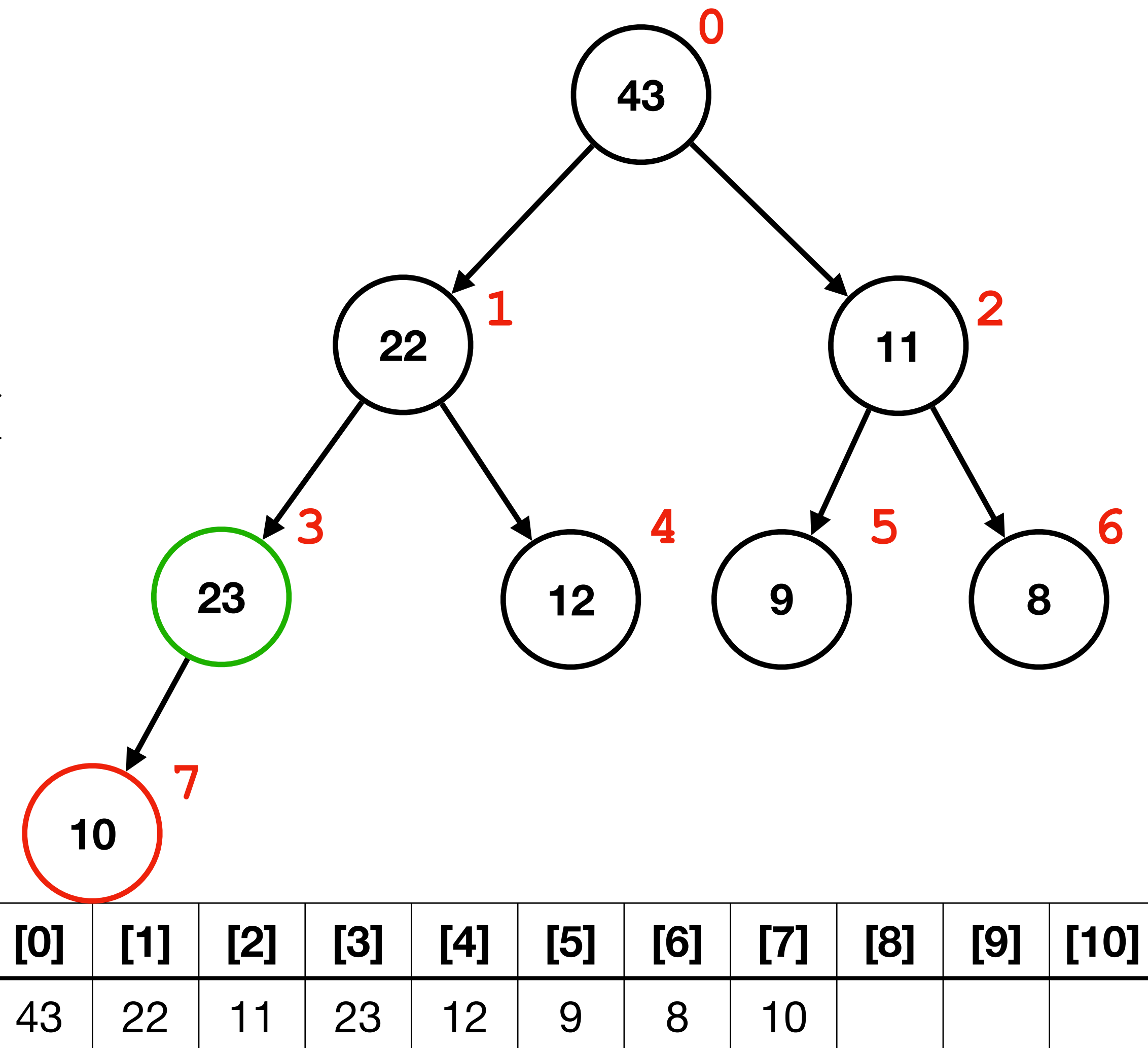
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→

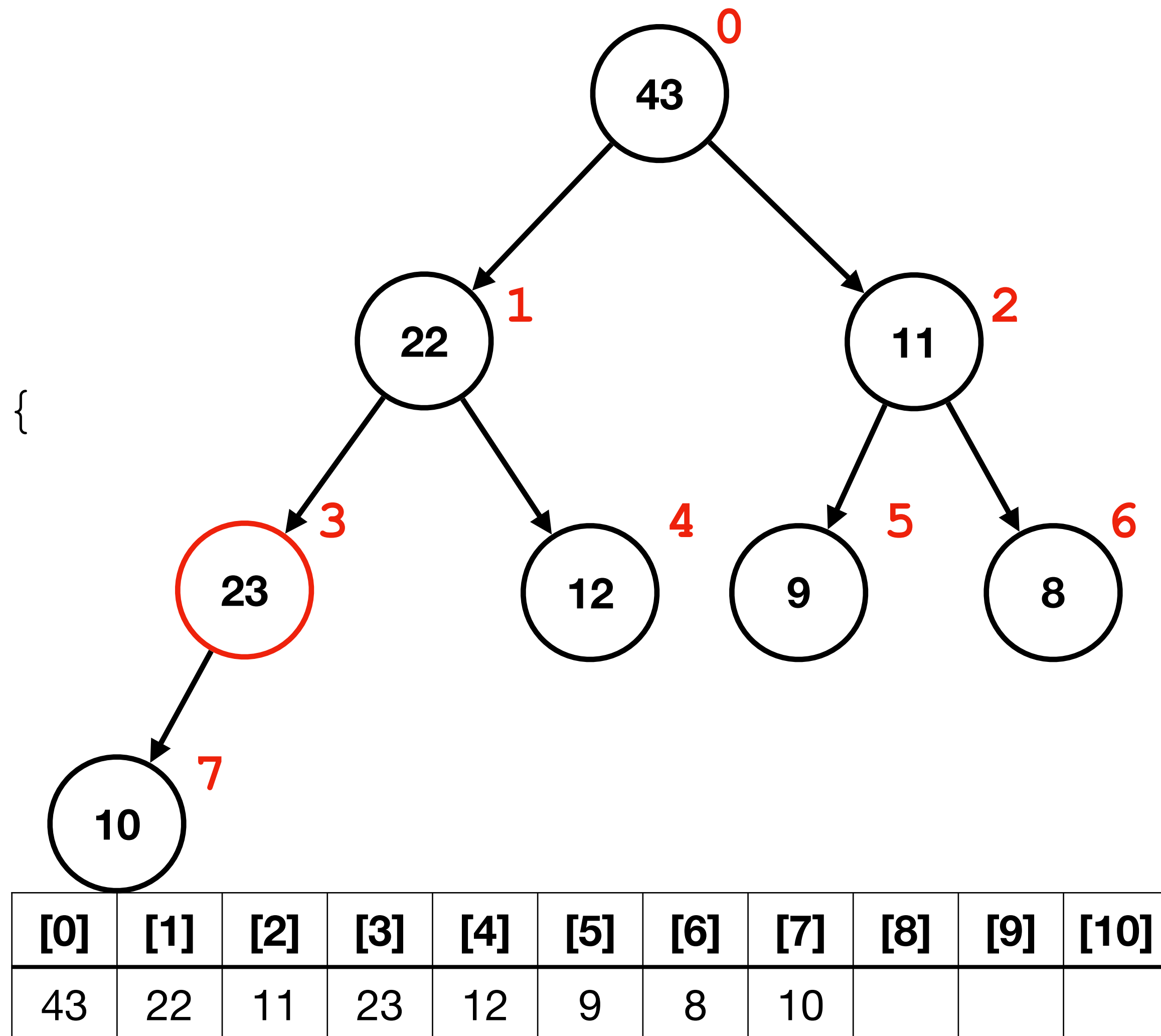


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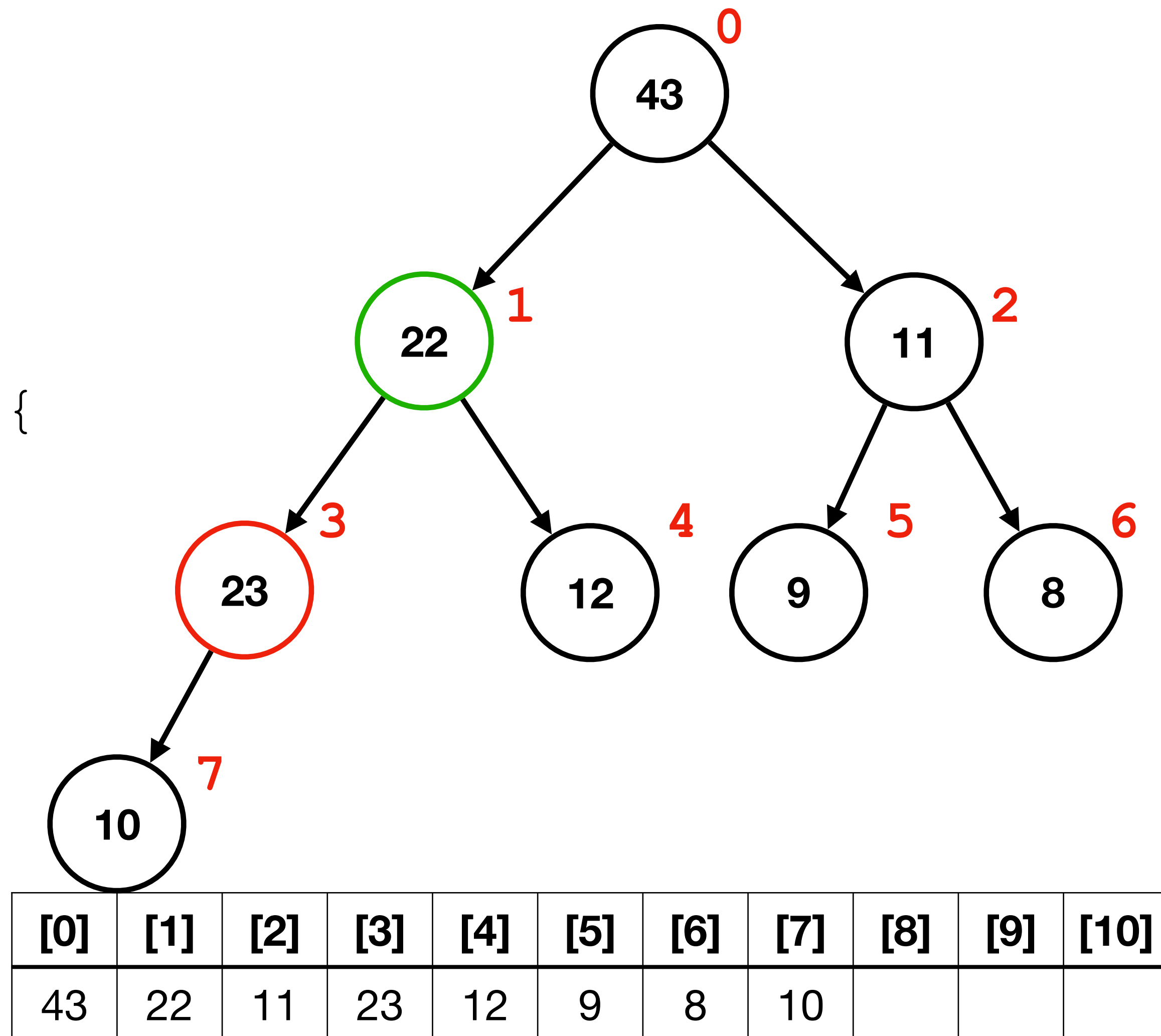


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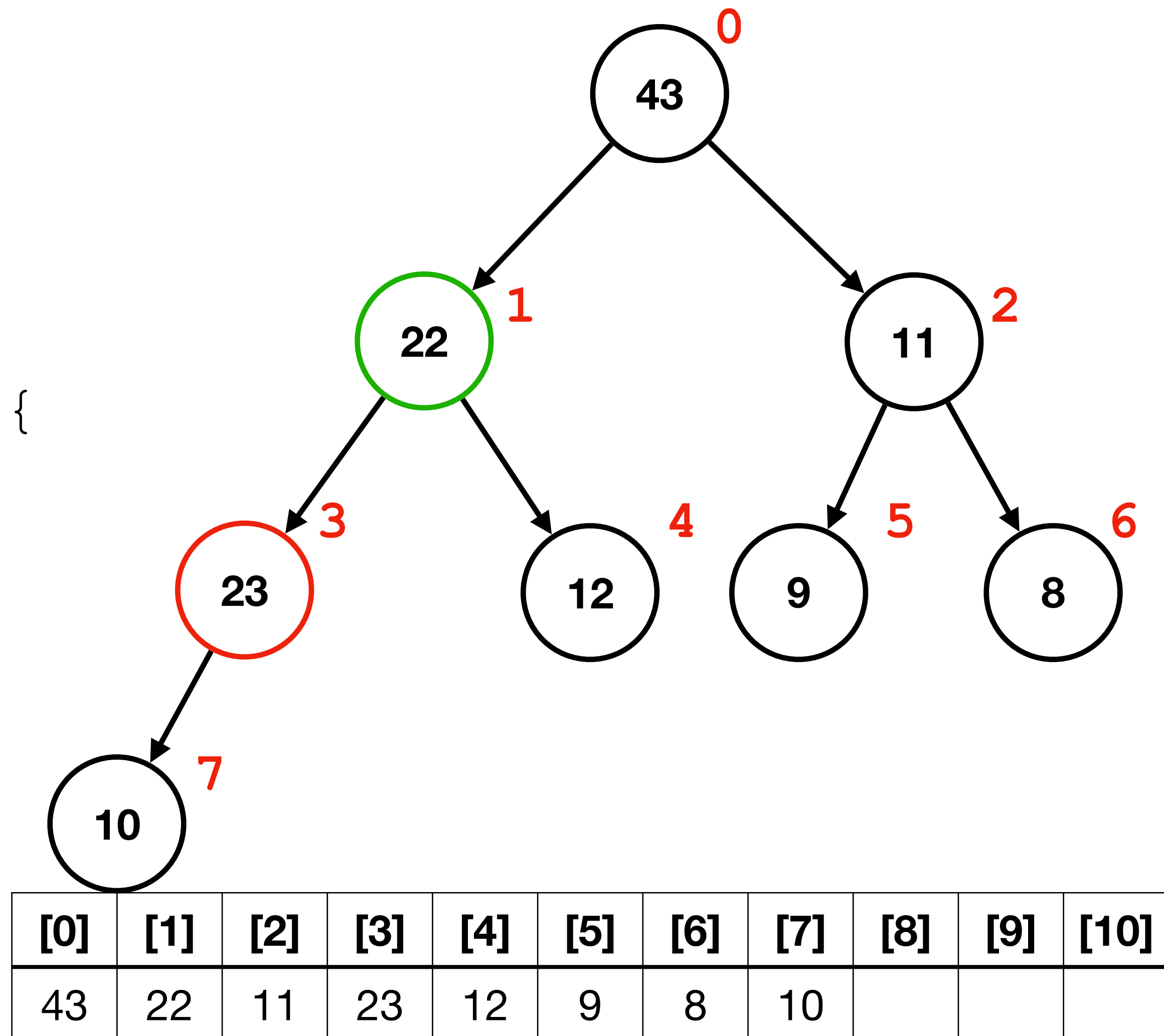


Heap

Bubble Up

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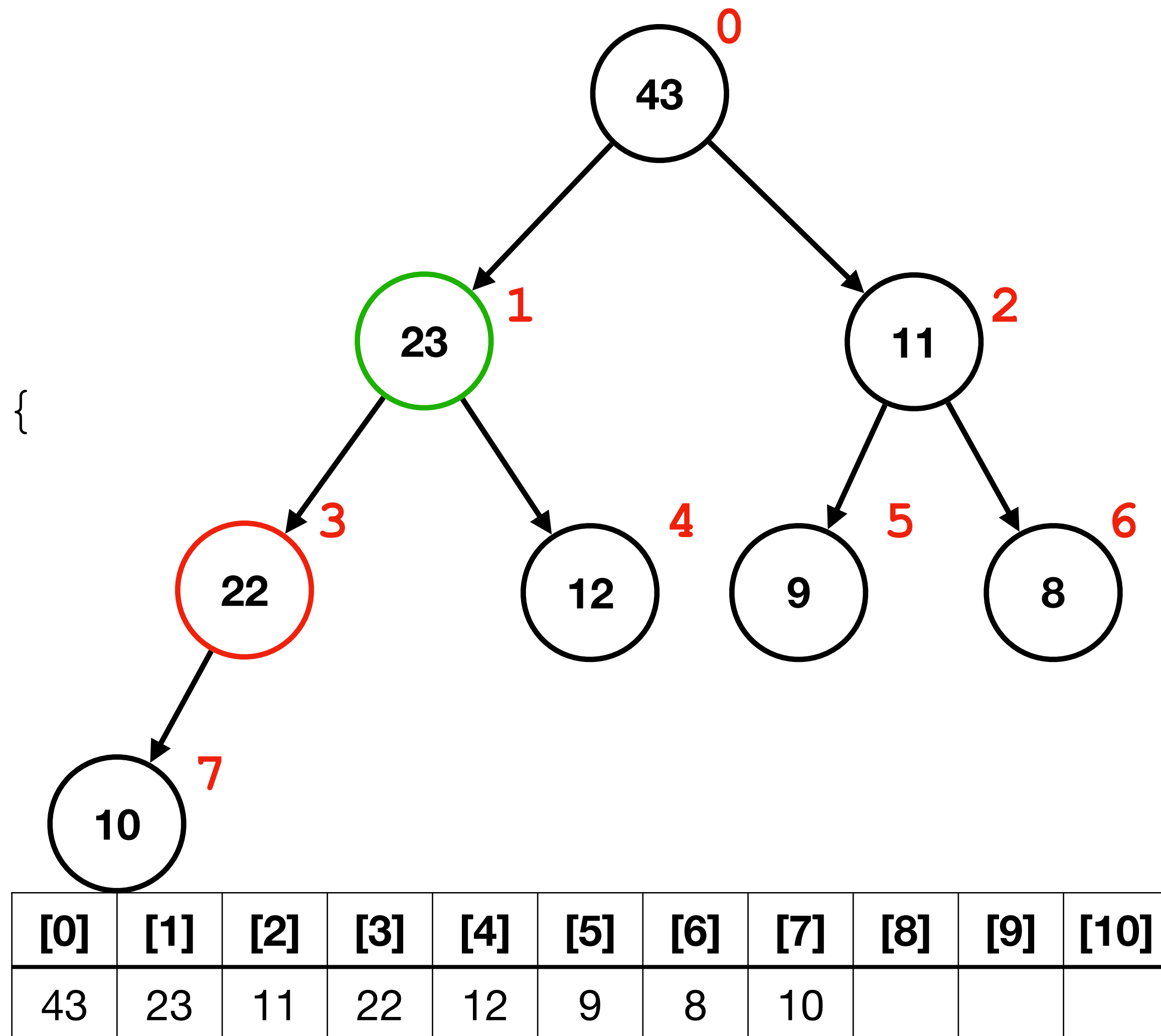
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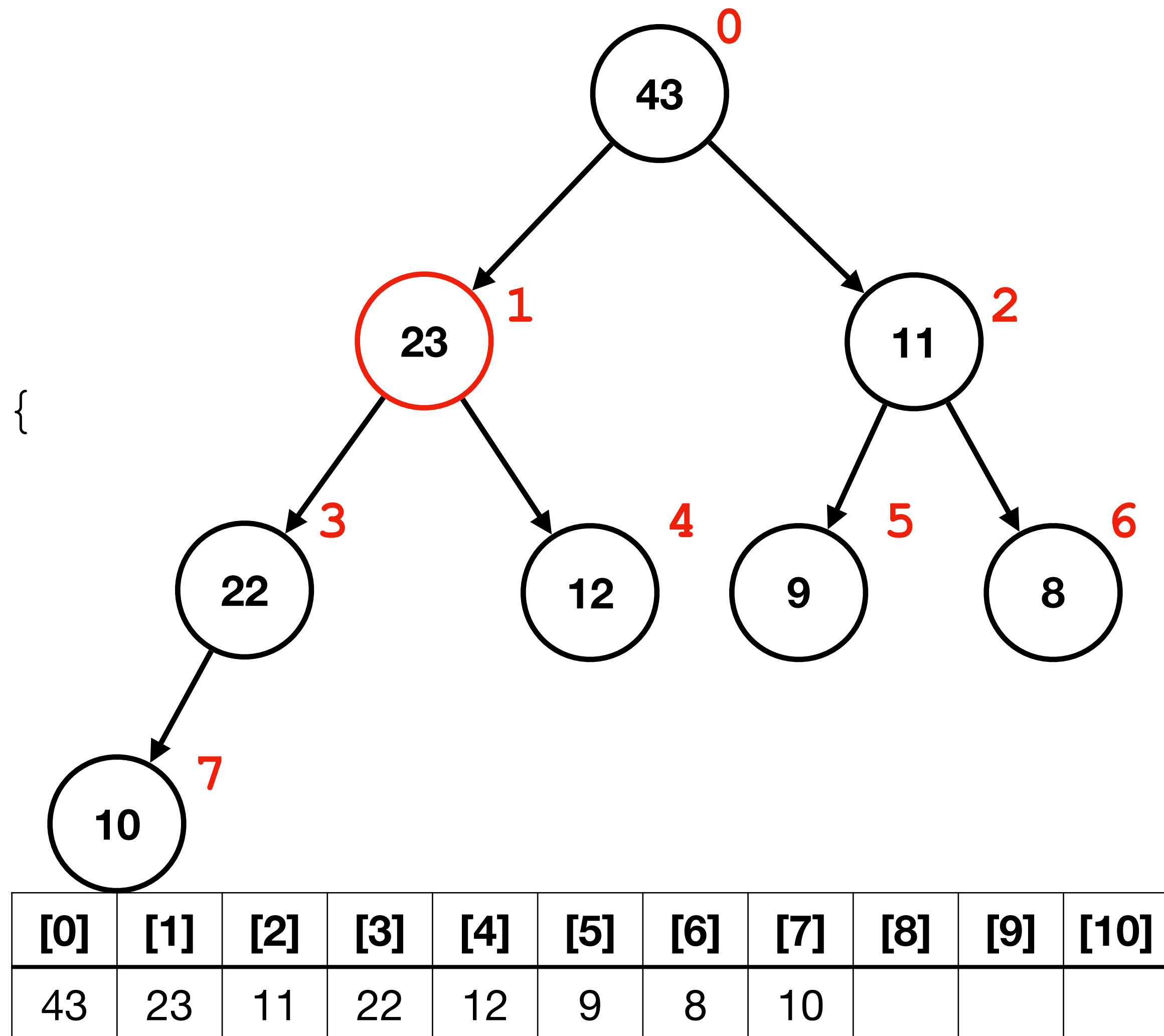
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➔

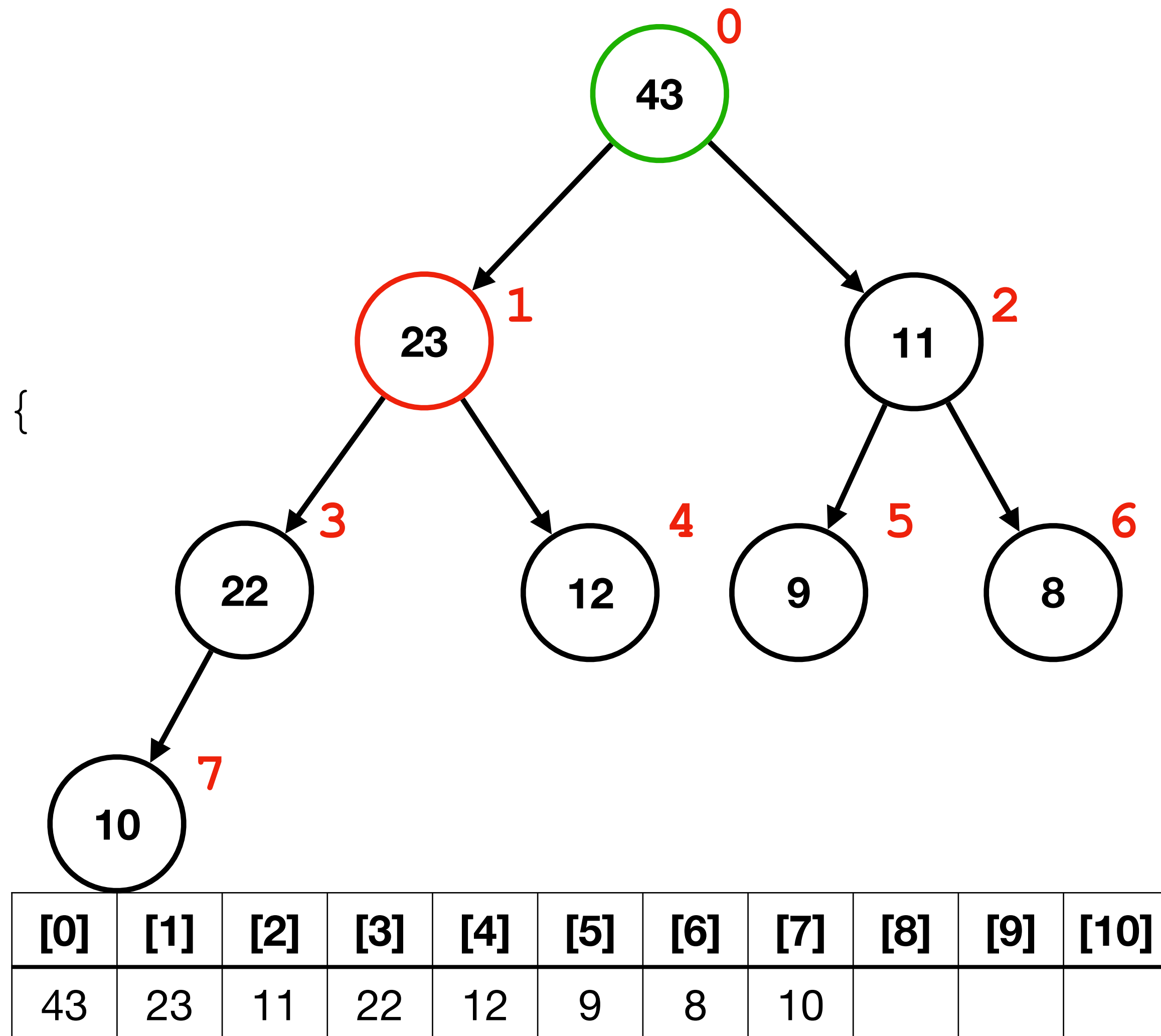


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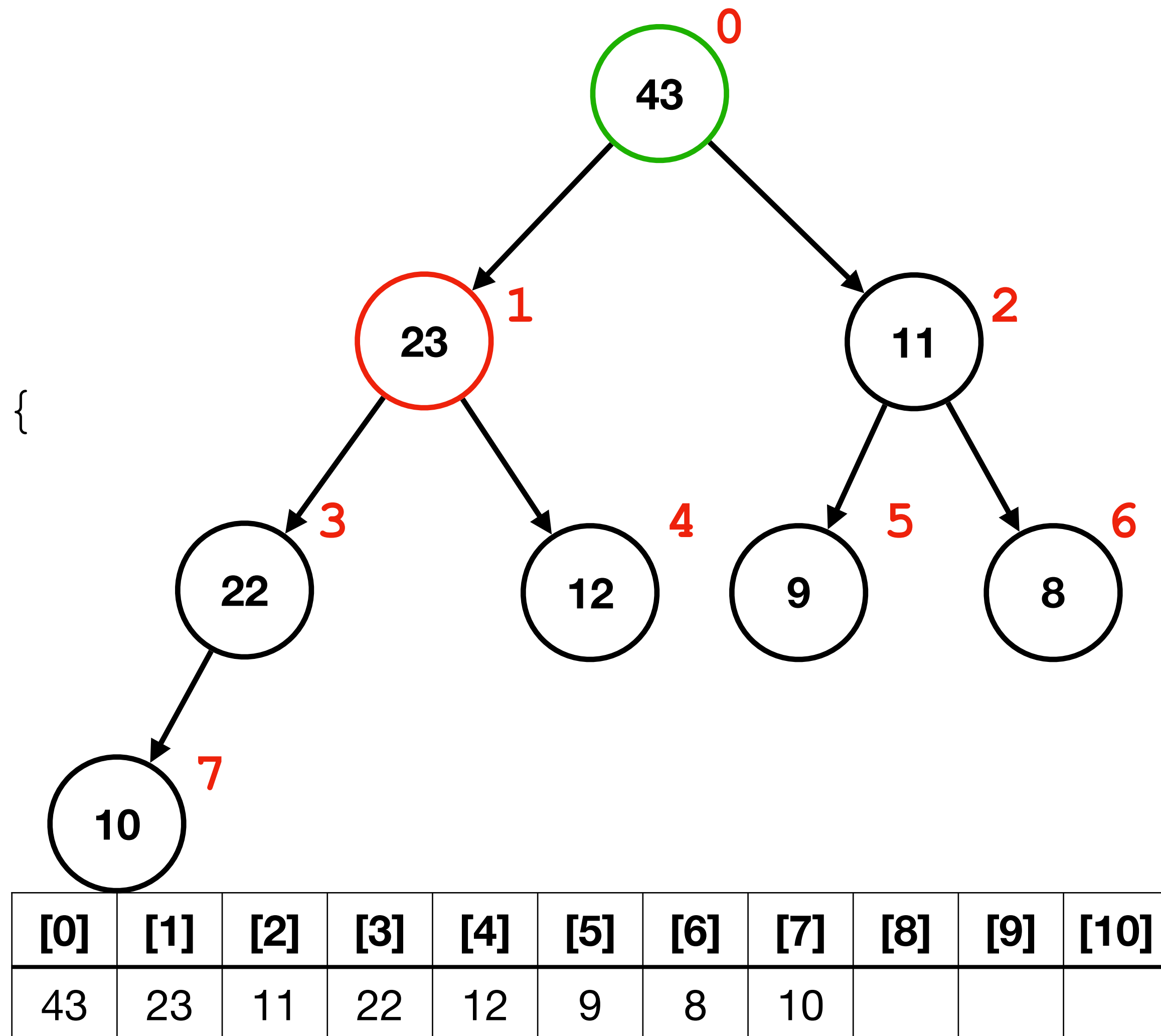


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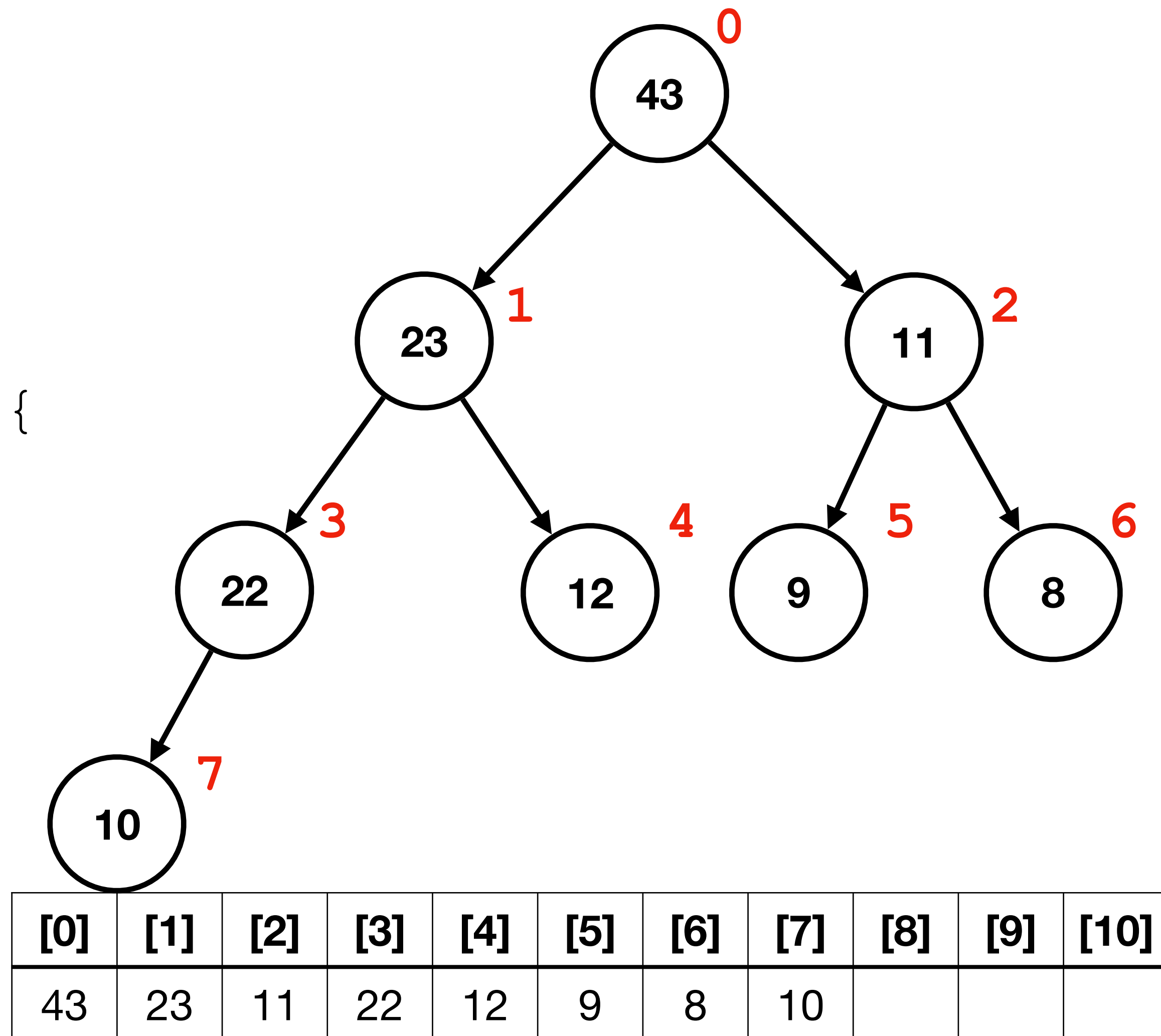


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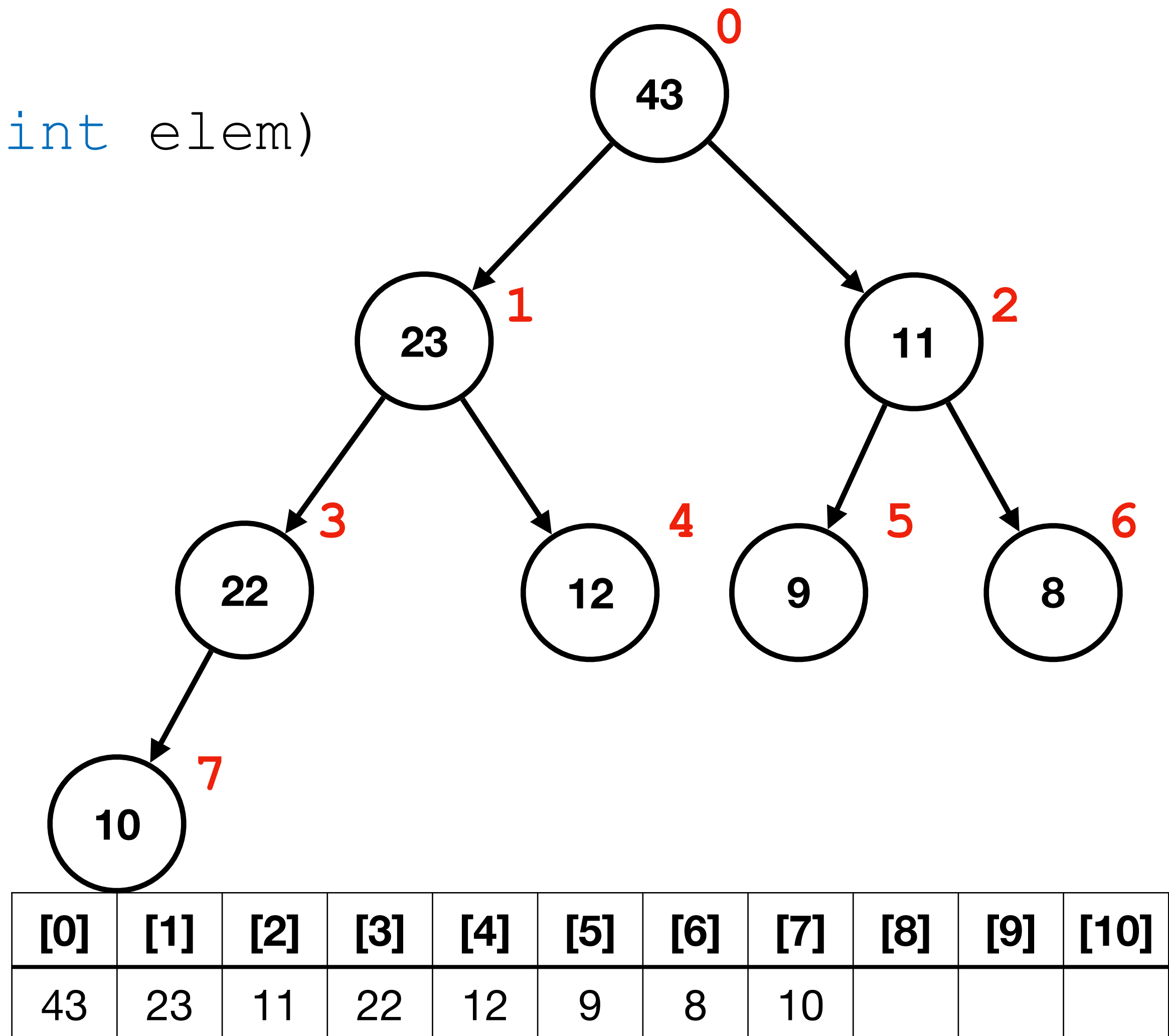


Heap

Bubble Up

```
void push_heap(int *arr, int len, int elem)
{
    arr[len] = elem;
    bubble_up(arr, len);
}
```

```
push_heap(arr, 8, 40);
```

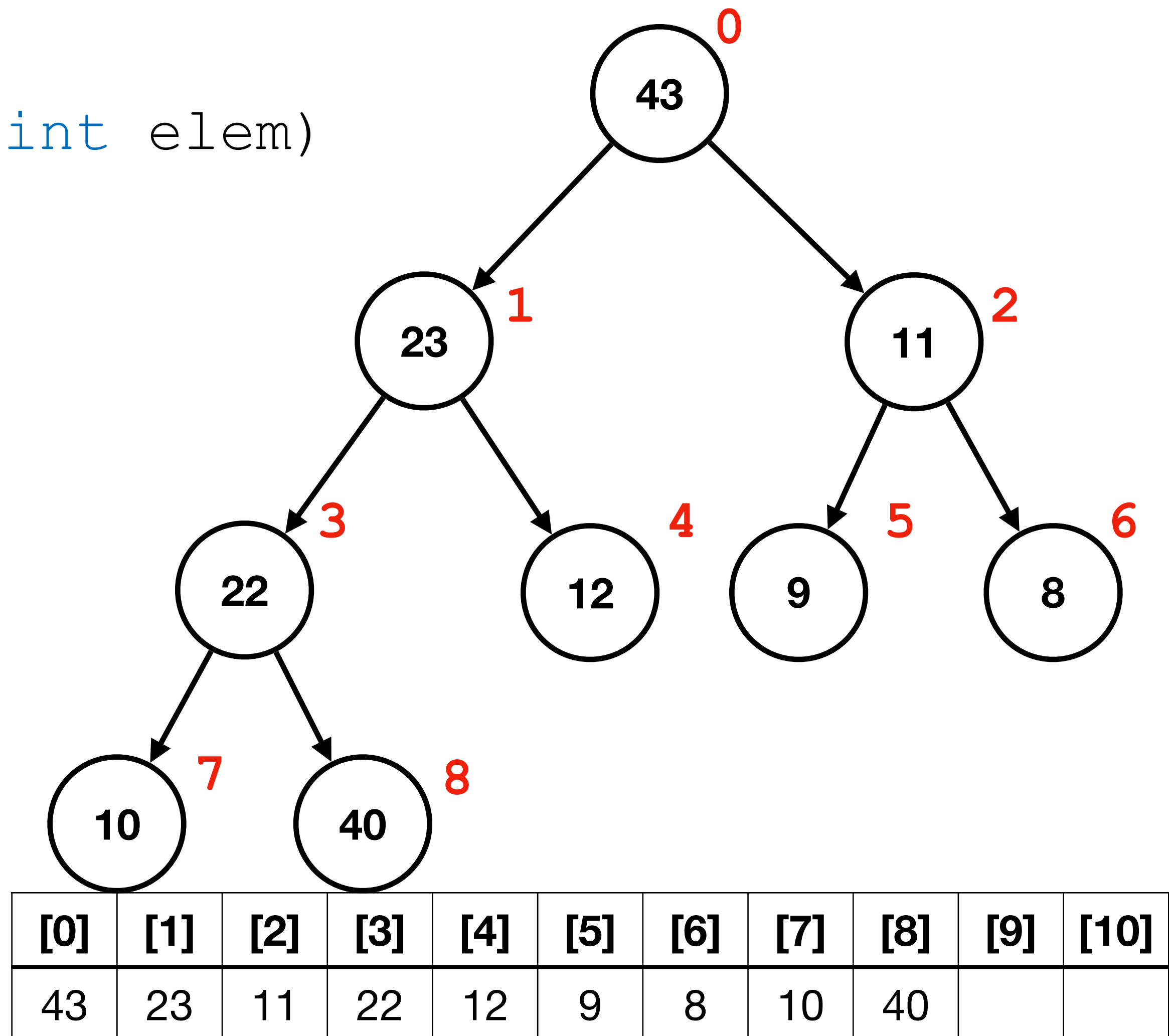


Heap

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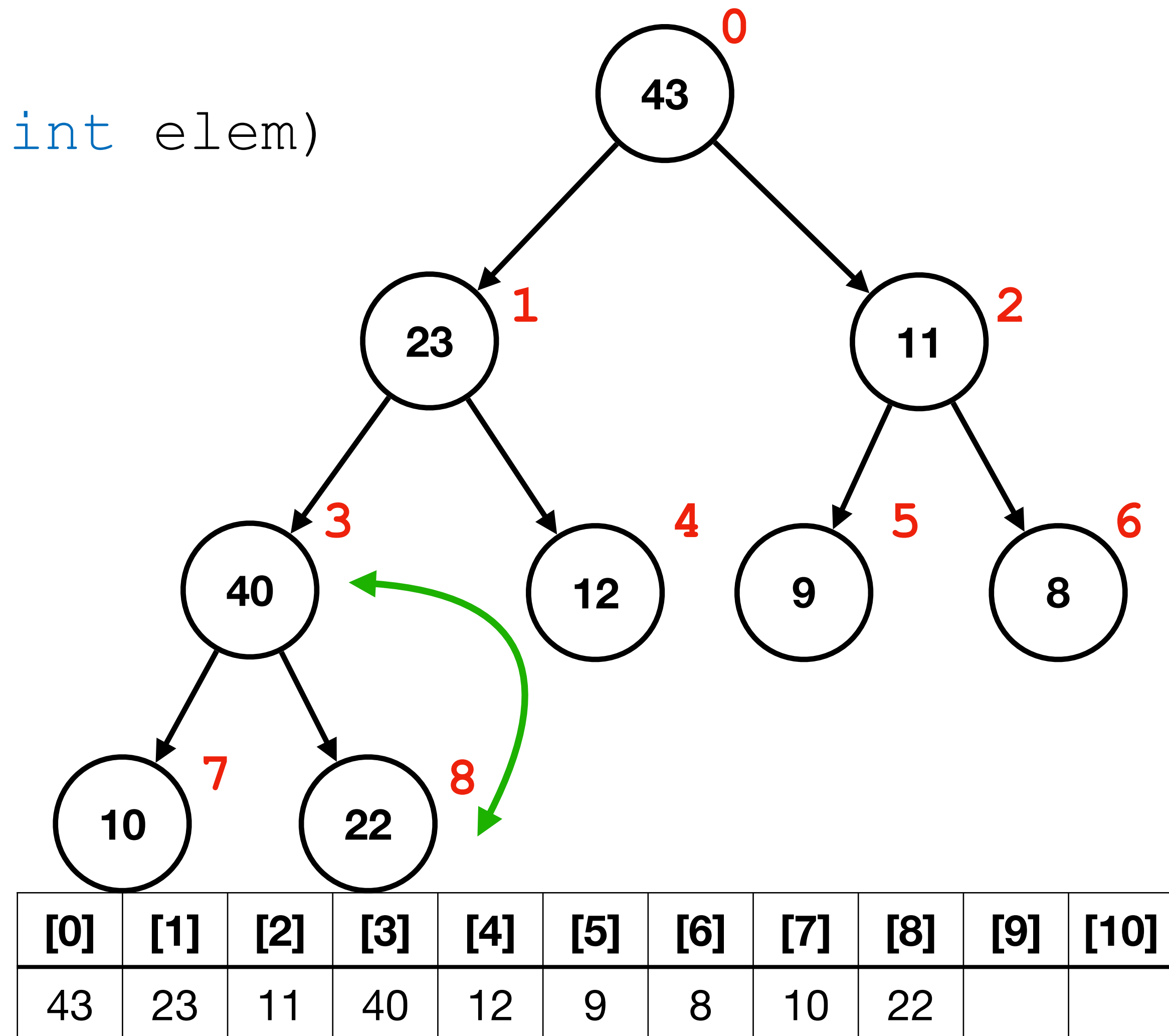


Heap

Bubble Up

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    arr[len] = elem;
    bubble_up(arr, len);
}
```

```
push_heap(arr, 8, 40);
```

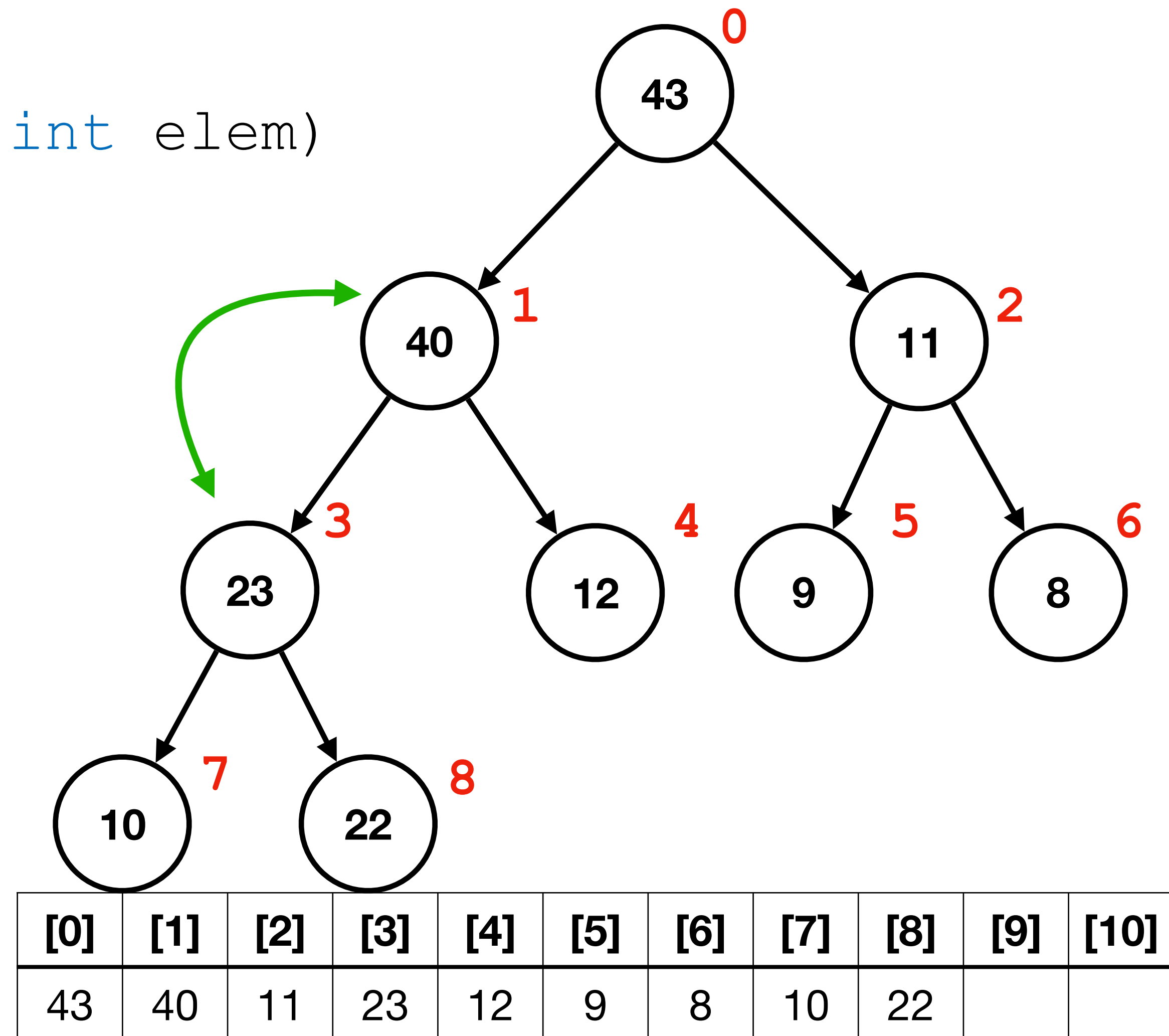


Heap

Bubble Up

```
void push_heap(int *arr, int len, int elem)
{
    arr[len] = elem;
    bubble_up(arr, len);
}
```

```
push_heap(arr, 8, 40);
```



Heap

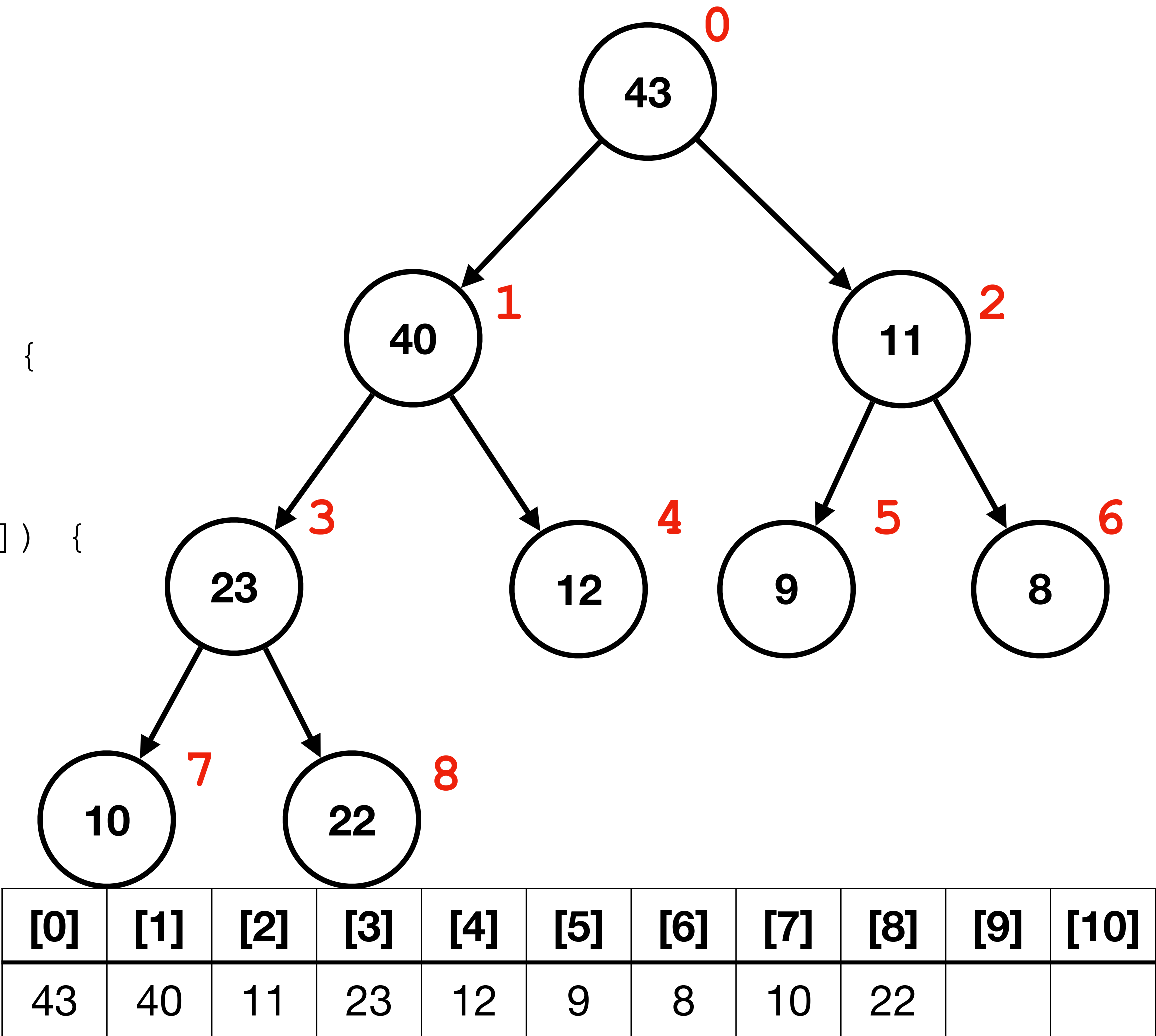
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
        int left = 2 * i + 1;
        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

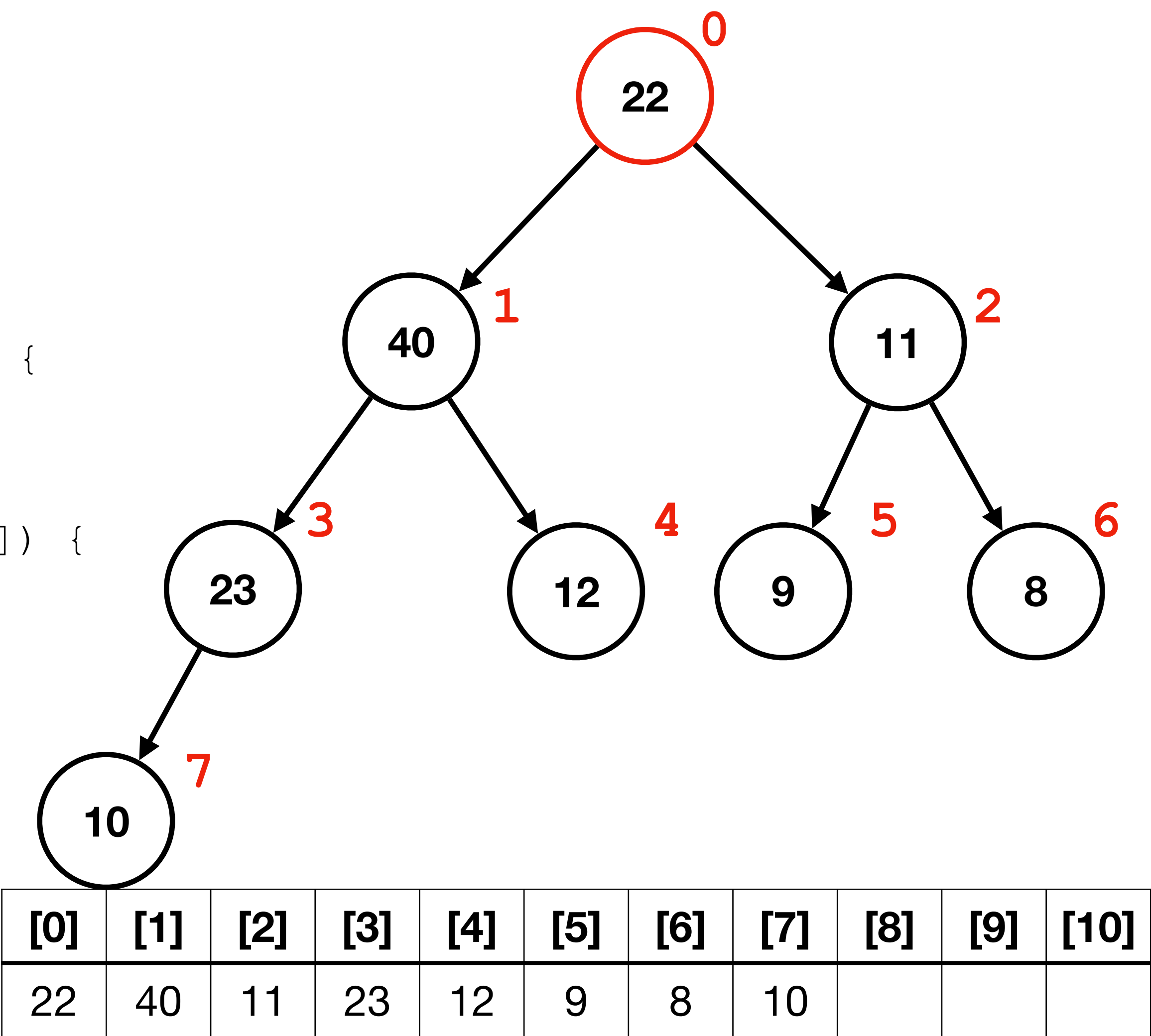
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
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        if (left < len && arr[left] > arr[largest]) {
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        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

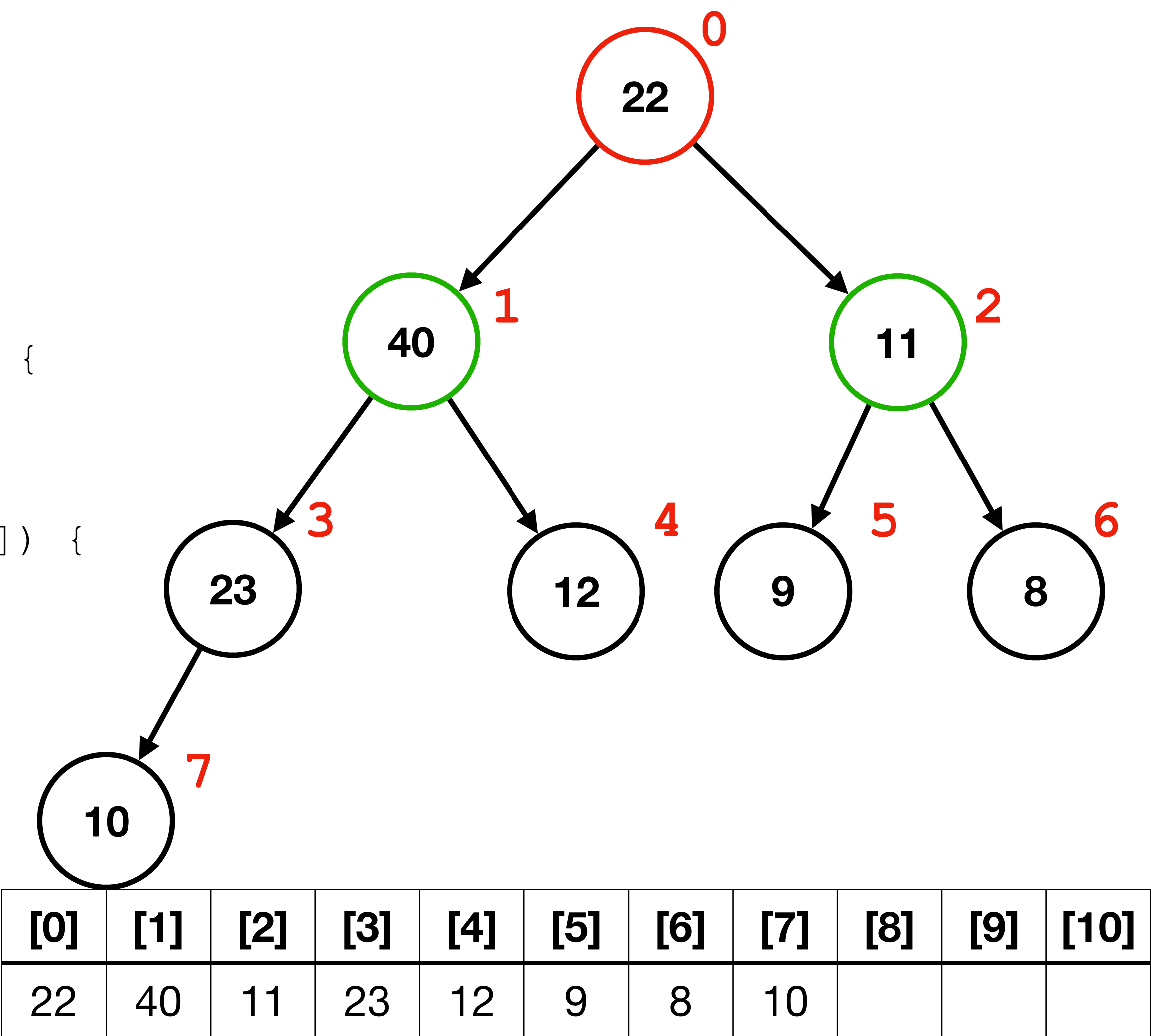
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
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        if (left < len && arr[left] > arr[largest]) {
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            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

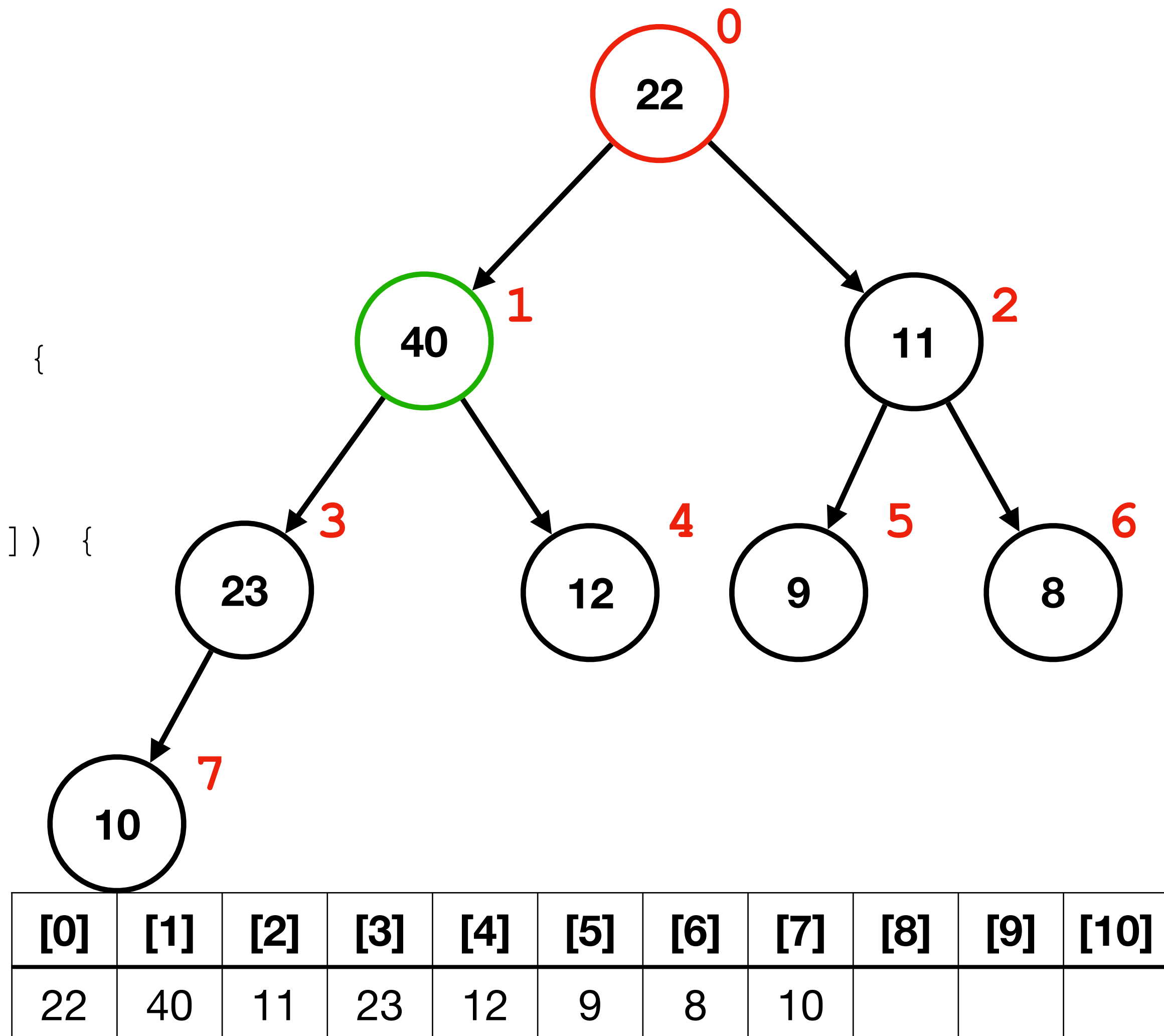
Bubble Down

```
void bubble_down(int *arr, int len, int i)
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        if (left < len && arr[left] > arr[largest]) {
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            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

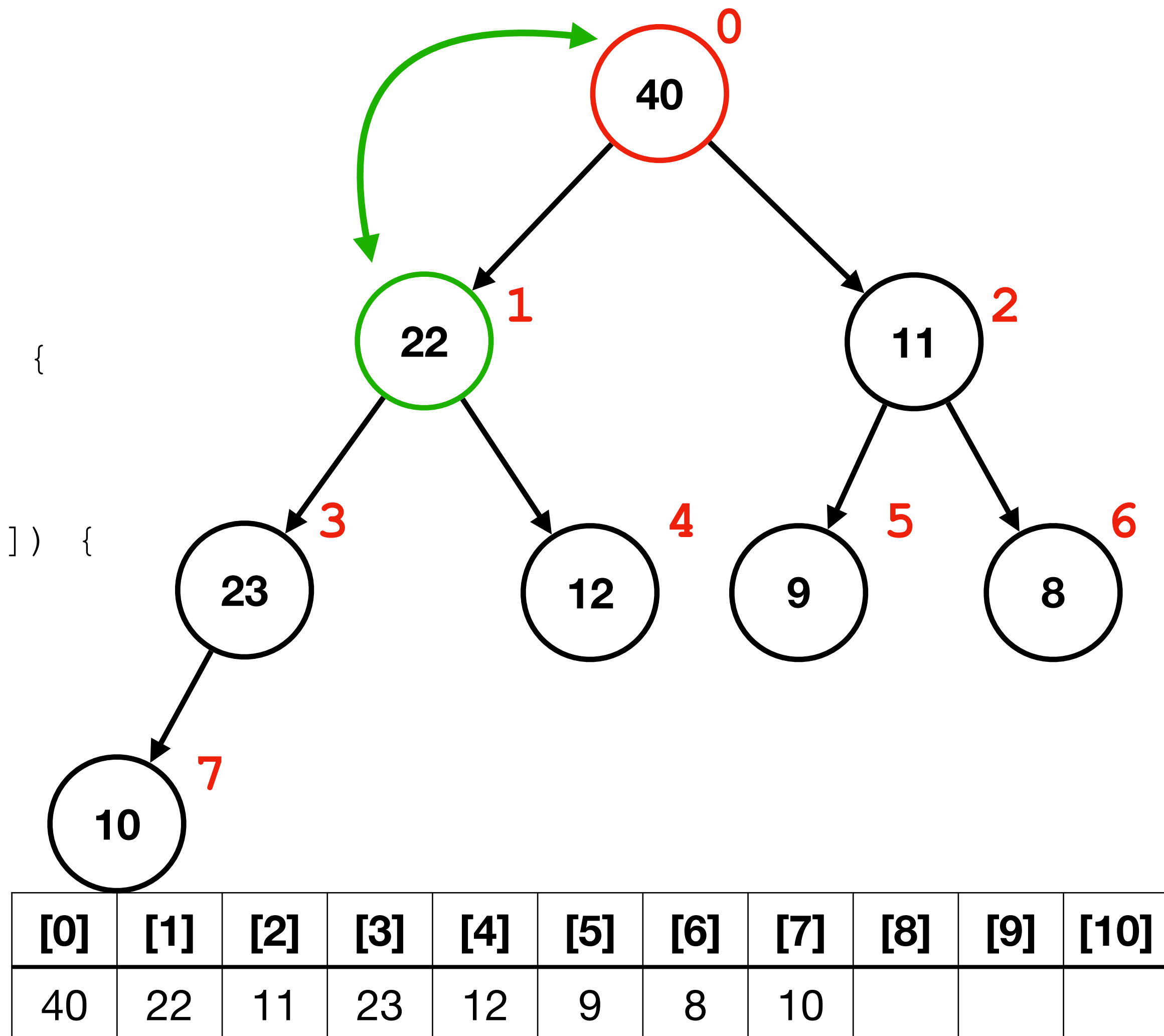
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
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        if (left < len && arr[left] > arr[largest]) {
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        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

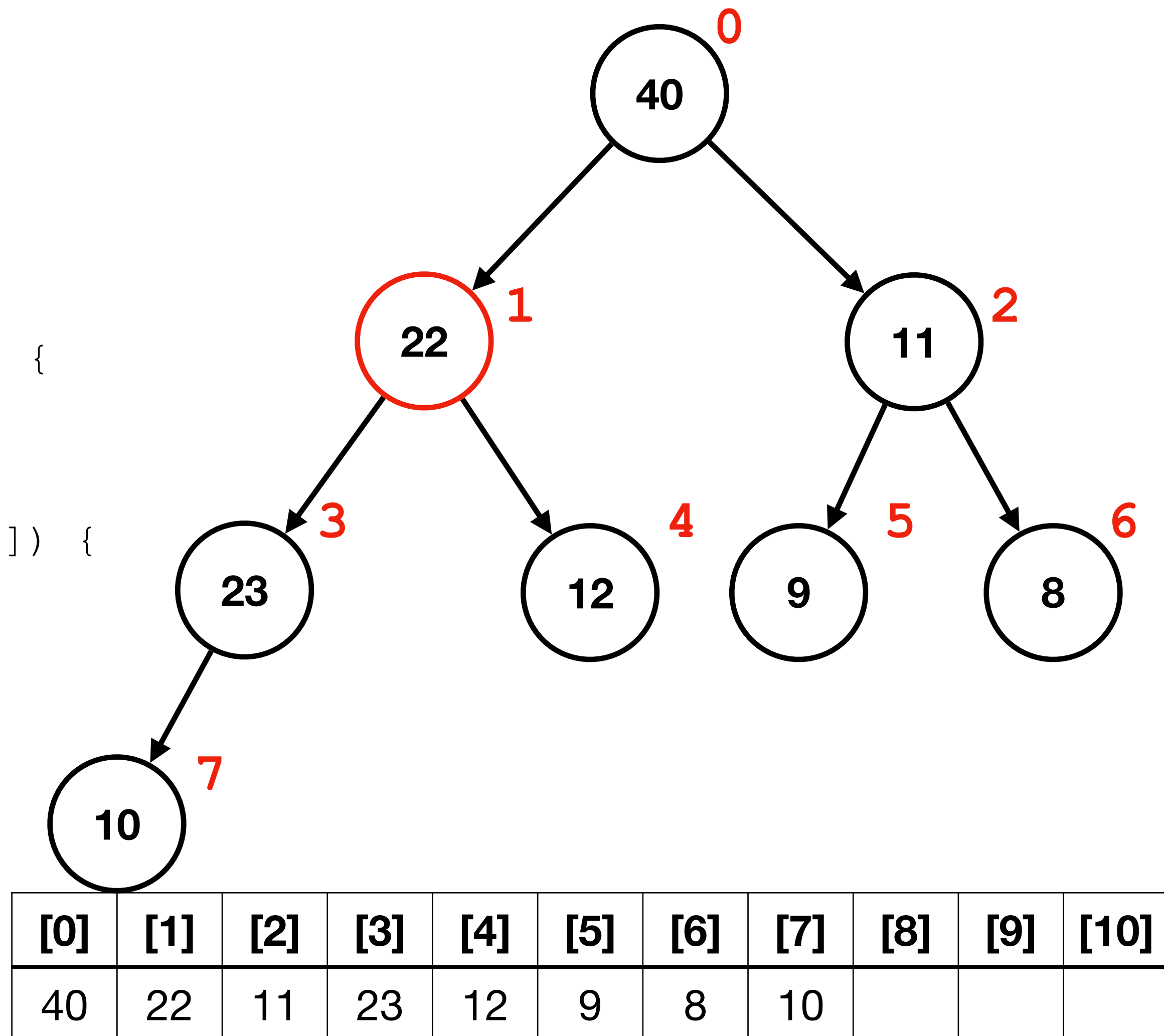
Bubble Down

```
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    for (;;) {
        int largest = i;
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        if (left < len && arr[left] > arr[largest]) {
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        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

Bubble Down

```
void bubble_down(int *arr, int len, int i)
```

```
{
```

```
    for (;;) {
```

```
        int largest = i;
```

```
        int left = 2 * i + 1;
```

```
        int right = 2 * i + 2;
```



```
        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }
```

```
        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }
```

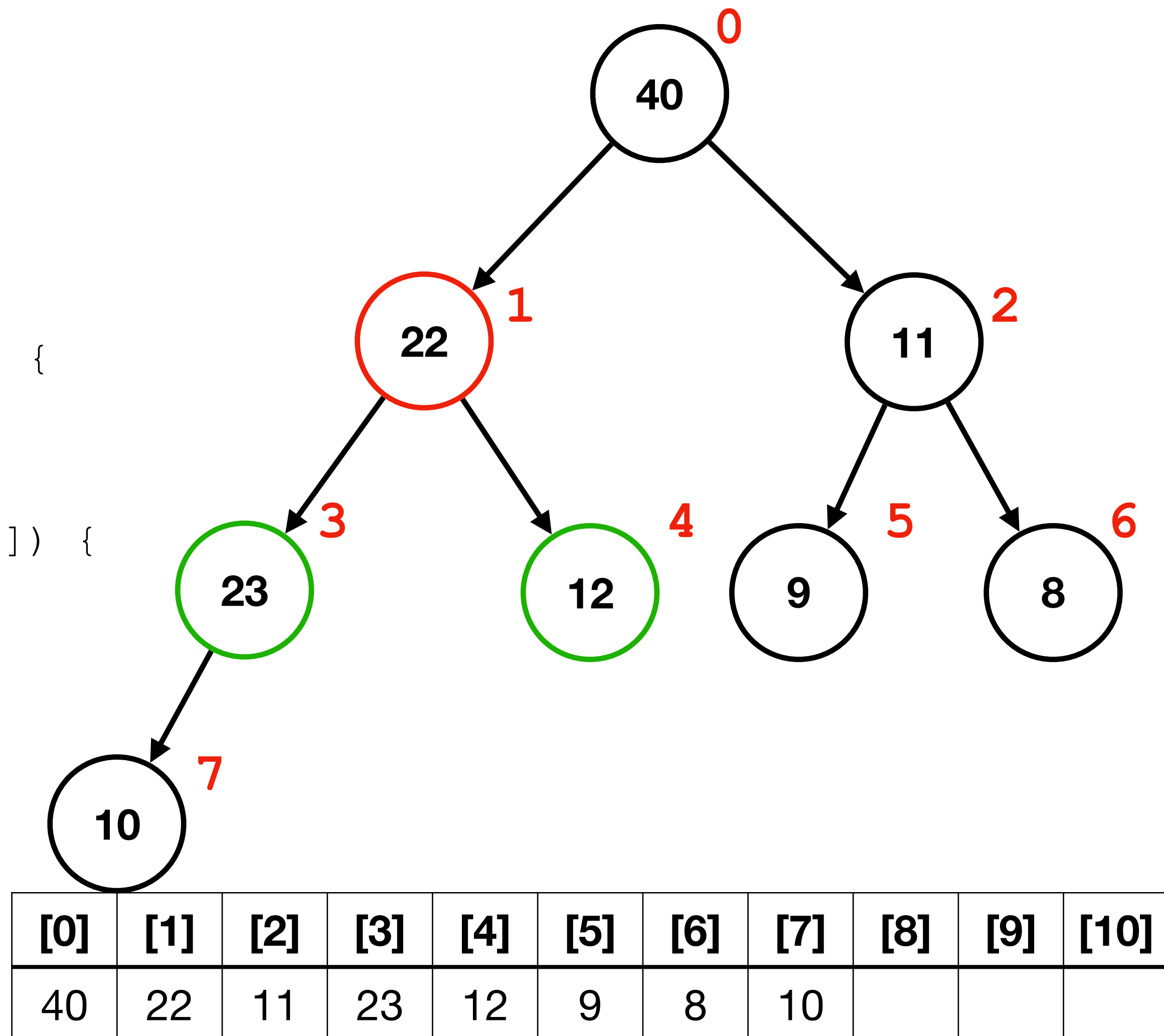
```
        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
```

```
            break;
```

```
        }
```

```
    }
```

```
}
```



Heap

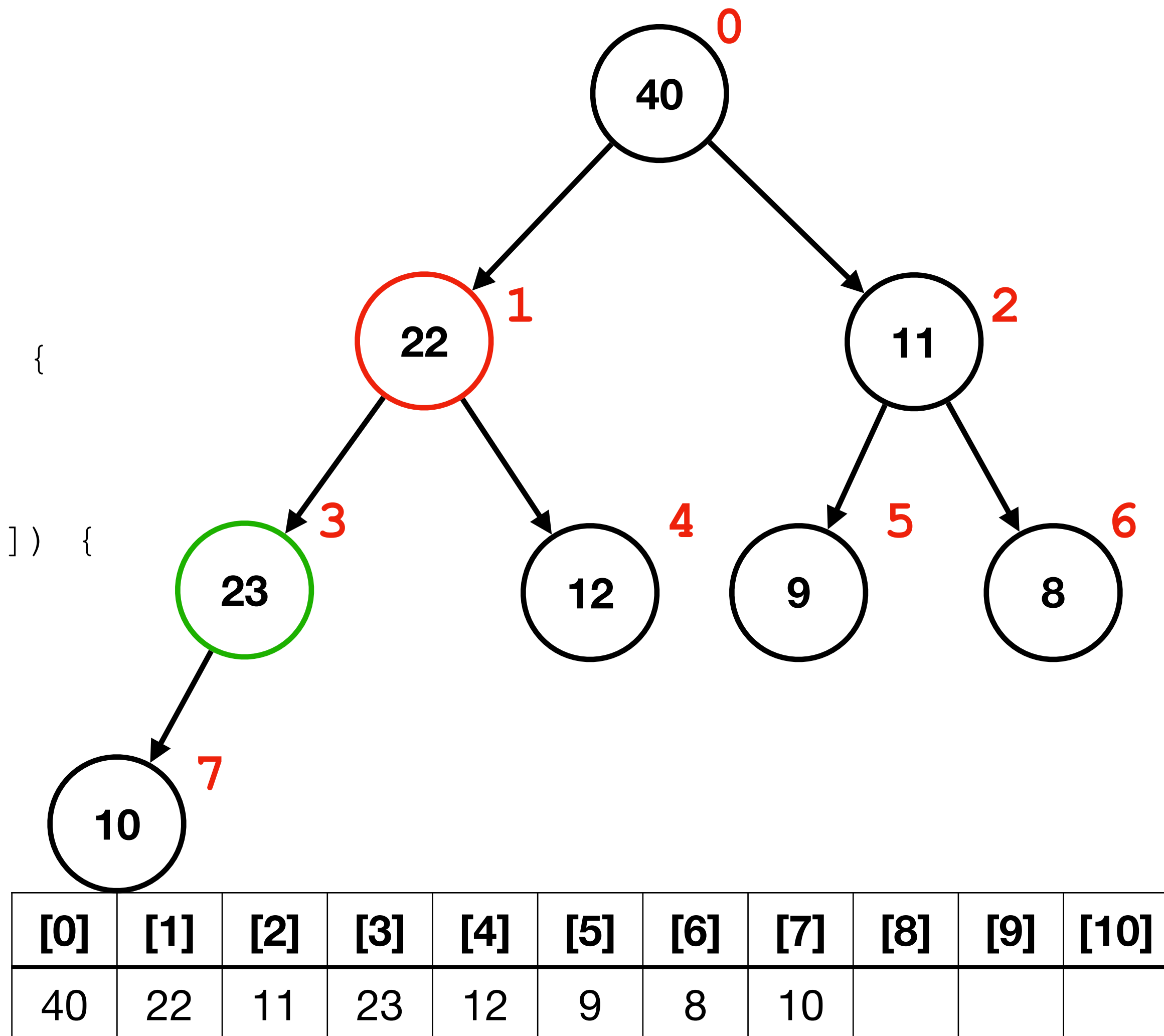
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
        int left = 2 * i + 1;
        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        → if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

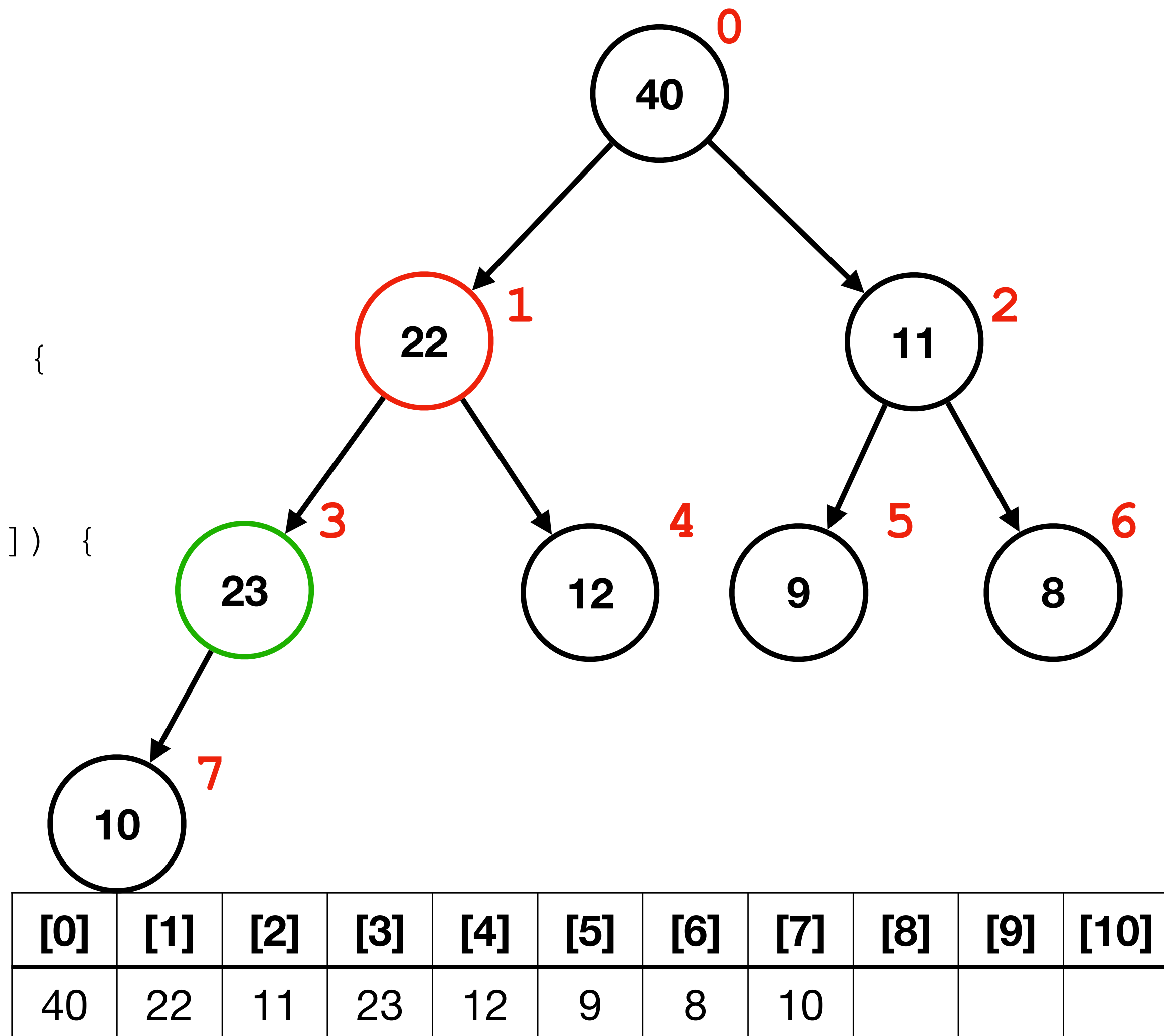
Bubble Down

```
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{
    for (;;) {
        int largest = i;
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        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

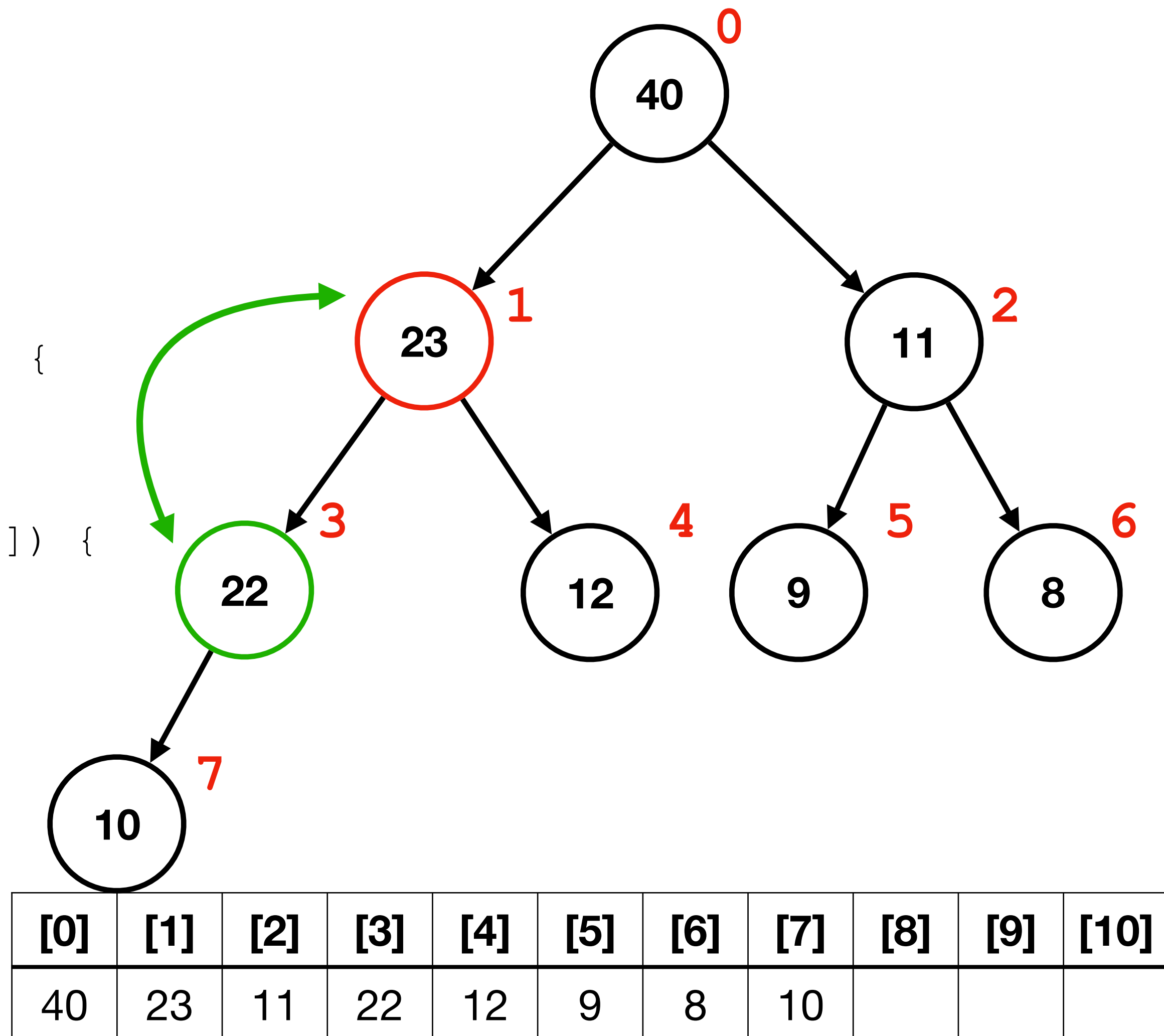
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
        int left = 2 * i + 1;
        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

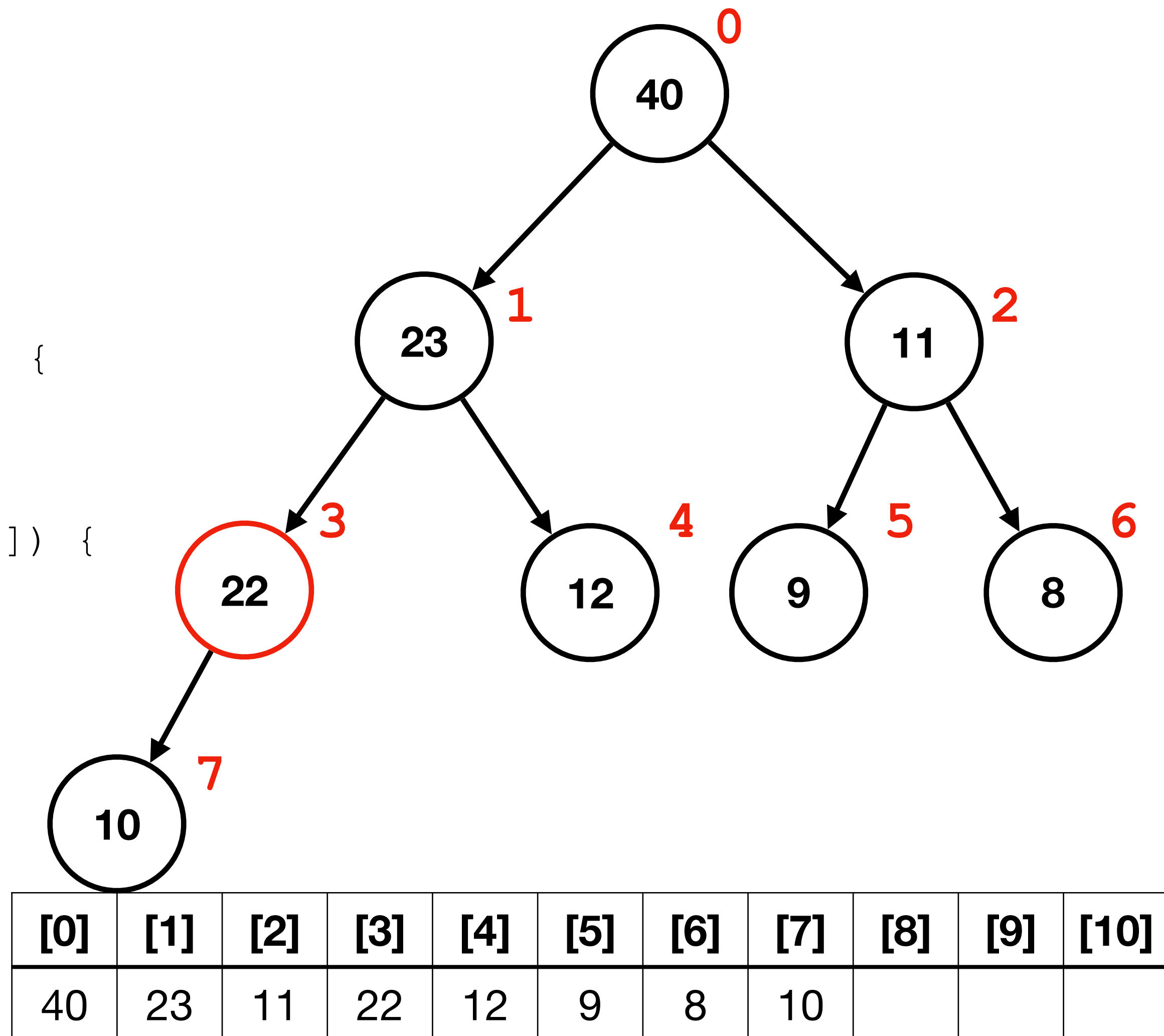
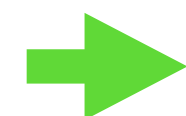
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
        int left = 2 * i + 1;
        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```



Heap

Bubble Down

```
void bubble_down(int *arr, int len, int i)
```

```
{
```

```
    for (;;) {
```

```
        int largest = i;
```

```
        int left = 2 * i + 1;
```

```
        int right = 2 * i + 2;
```



```
        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }
```

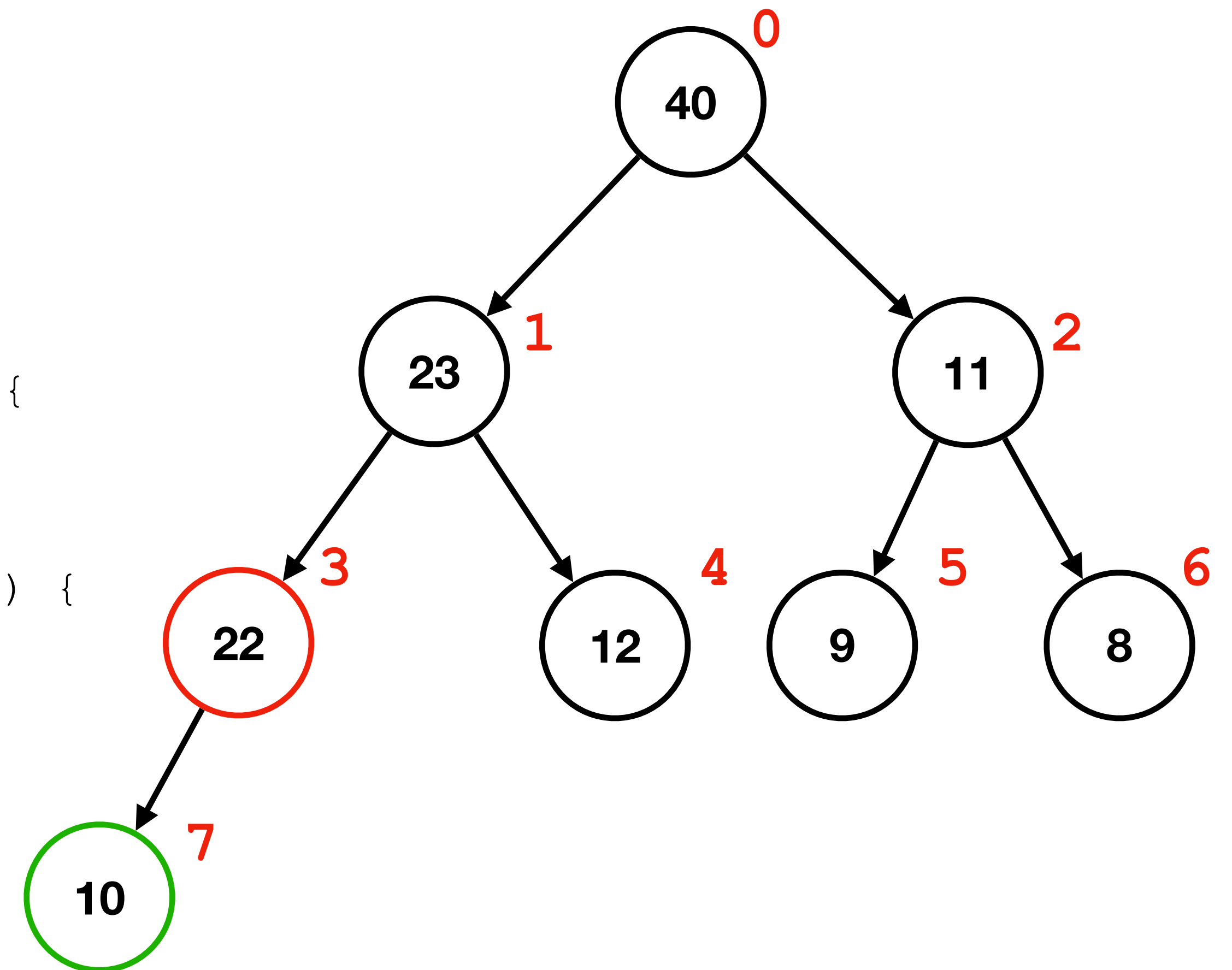
```
        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }
```

```
        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
```

```
            break;
        }
```

```
    }
```

```
}
```



[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]	[10]
40	23	11	22	12	9	8	10			

Heap

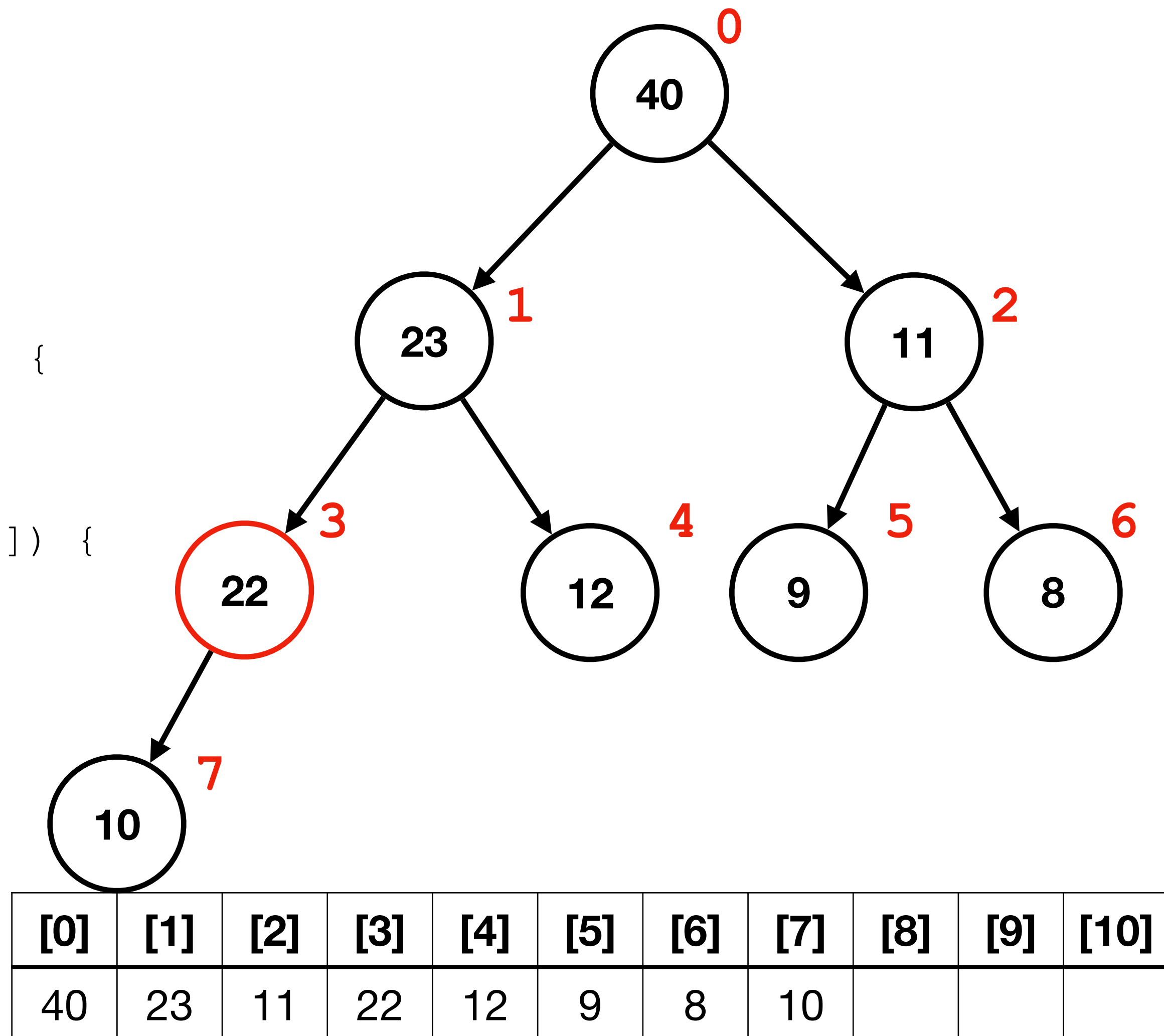
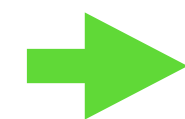
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
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        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
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        if (largest != i) {
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            i = largest;
        } else {
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        }
    }
}
```



Heap

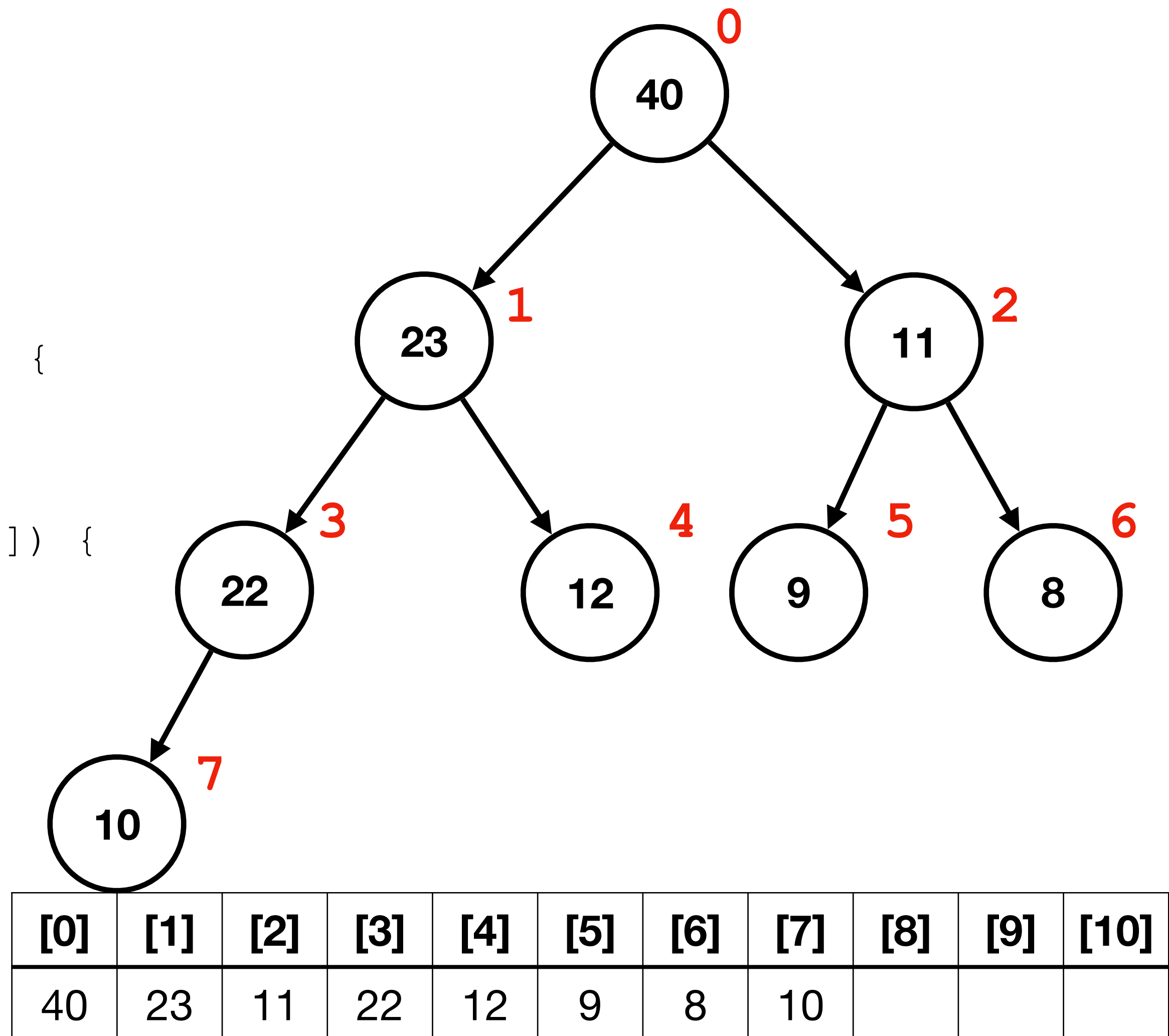
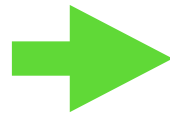
Bubble Down

```
void bubble_down(int *arr, int len, int i)
{
    for (;;) {
        int largest = i;
        int left = 2 * i + 1;
        int right = 2 * i + 2;

        if (left < len && arr[left] > arr[largest]) {
            largest = left;
        }

        if (right < len && arr[right] > arr[largest]) {
            largest = right;
        }

        if (largest != i) {
            swap(arr, i, largest);
            i = largest;
        } else {
            break;
        }
    }
}
```

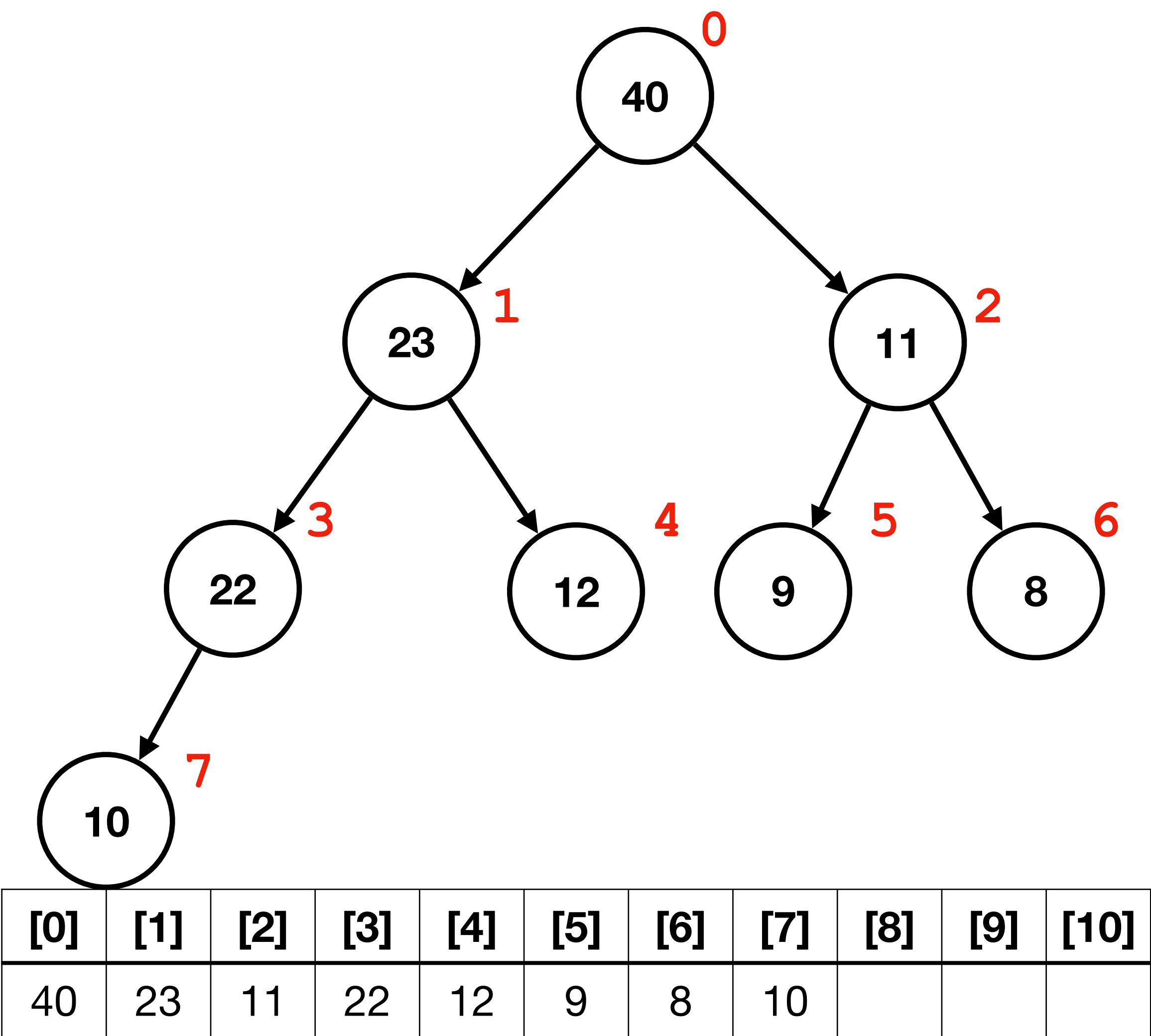


Heap

Bubble Down

```
int pop_heap(int *arr, int len)
{
    int top = arr[0];
    arr[0] = arr[len - 1];

    bubble_down(arr, len - 1, 0);
}
```



Priority Queue

Implementations

	<code>insert</code>	<code>get_top</code>	<code>remove_top</code>
ArrayList	$O(1)$	$O(n)$	$O(n)$
Sorted ArrayList	$O(n)$	$O(1)$	$O(1)$
Sorted Linked List	$O(n)$	$O(1)$	$O(1)$
General BST	$O(n)$	$O(n)$	$O(n)$
Balanced BST	$O(\log n)$	$O(\log n)$	$O(\log n)$
Heap	$O(\log n)$	$O(1)$	$O(\log n)$

Heap

Heap Sort

- What is the best way to build a heap from scratch?

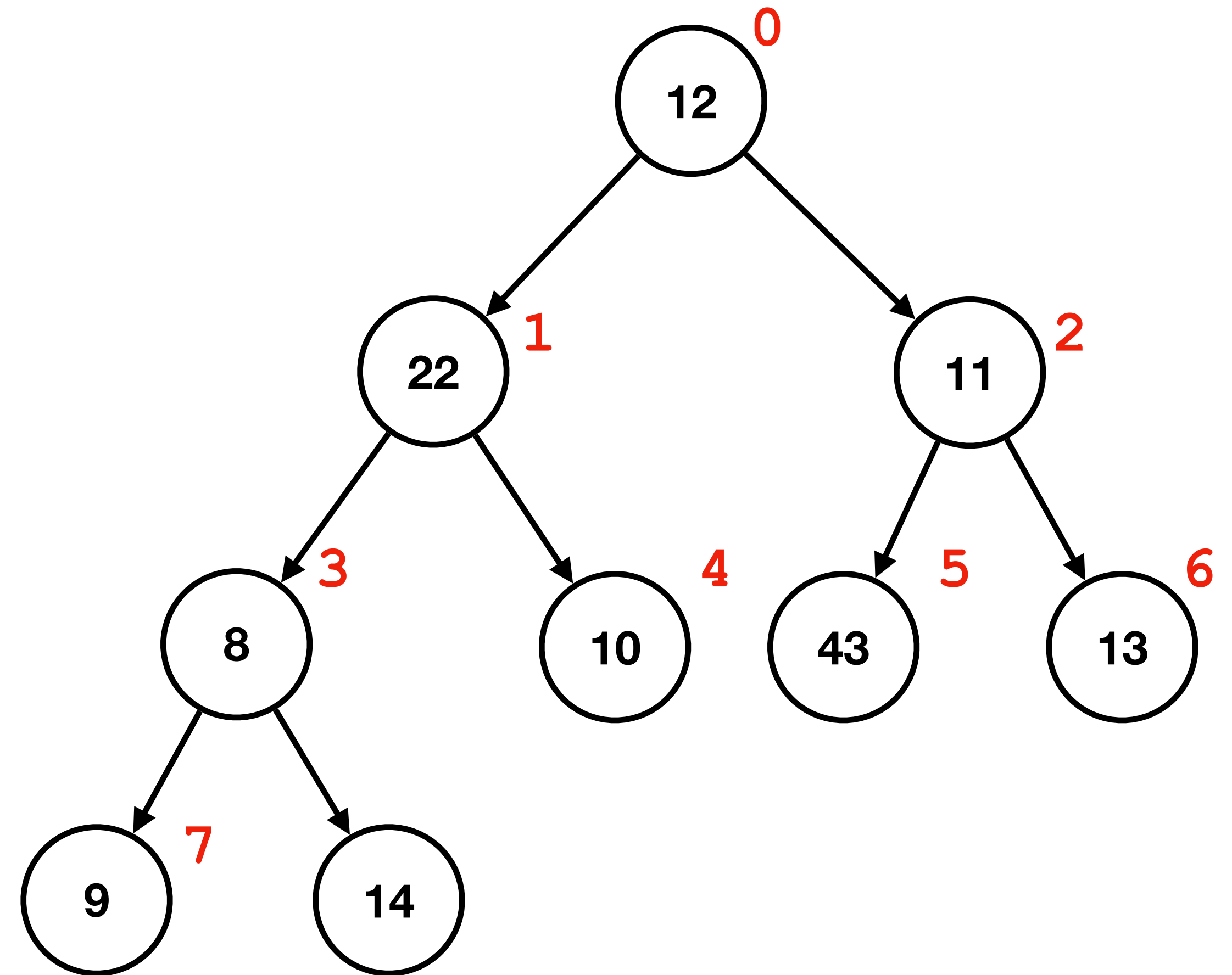
12, 22, 11, 8, 10, 43, 13, 9, 14

- We could insert each in turn.
- Insertion takes $O(\log n)$, doing it n times -- total complexity $O(n \log n)$.
- It's not bad, but we can do better!

Heap

Heapify

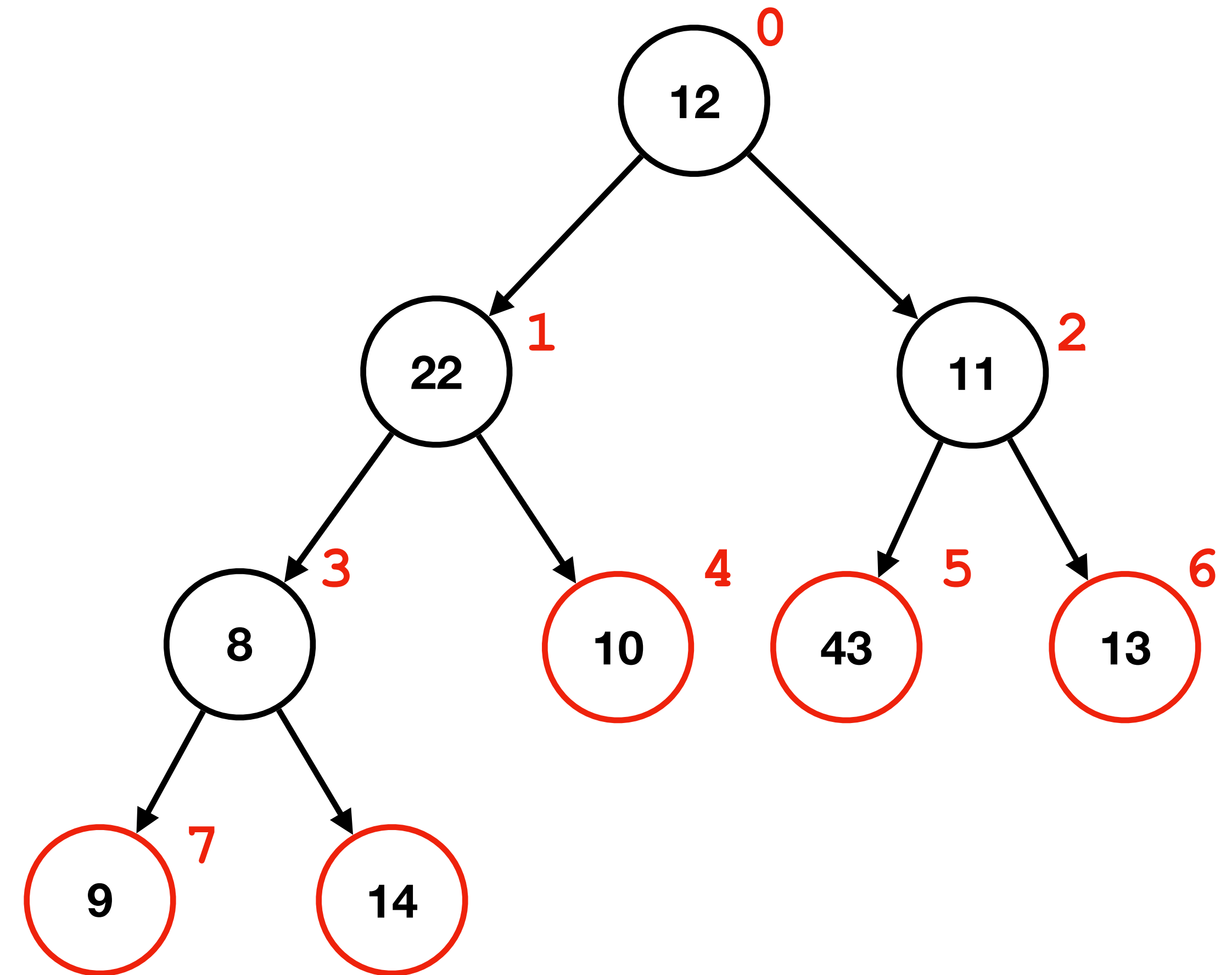
- Given an unsorted array:
12, 22, 11, 8, 10, 43, 13, 9, 14
- What if we just call this a *heap*?
 - Shape property is satisfied
 - Value property is not, but...
 - All leaves satisfy the value property (they have no children)



Heap

Heapify

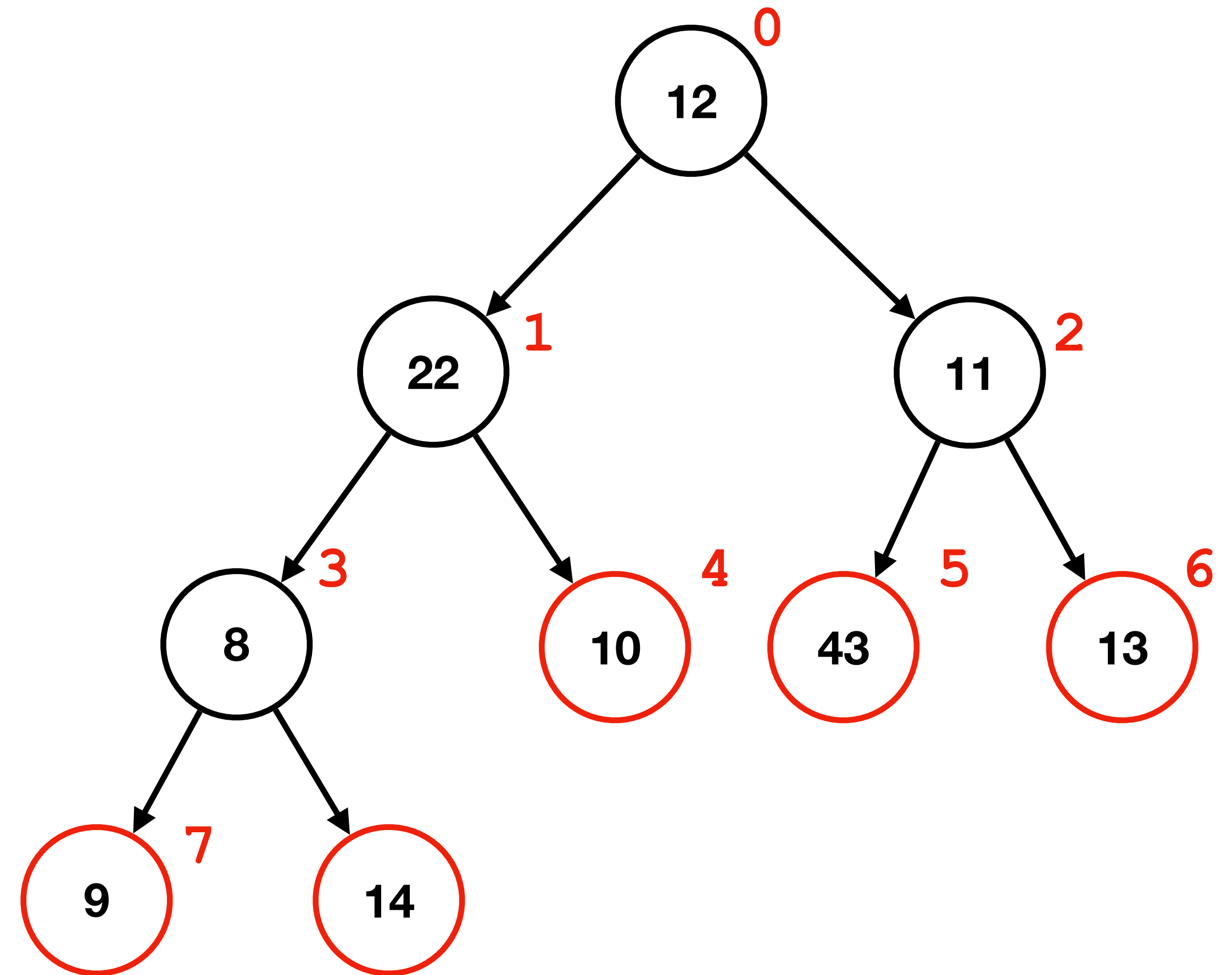
- Given an unsorted array:
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- What if we just call this a *heap*?
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Heap

Heapify

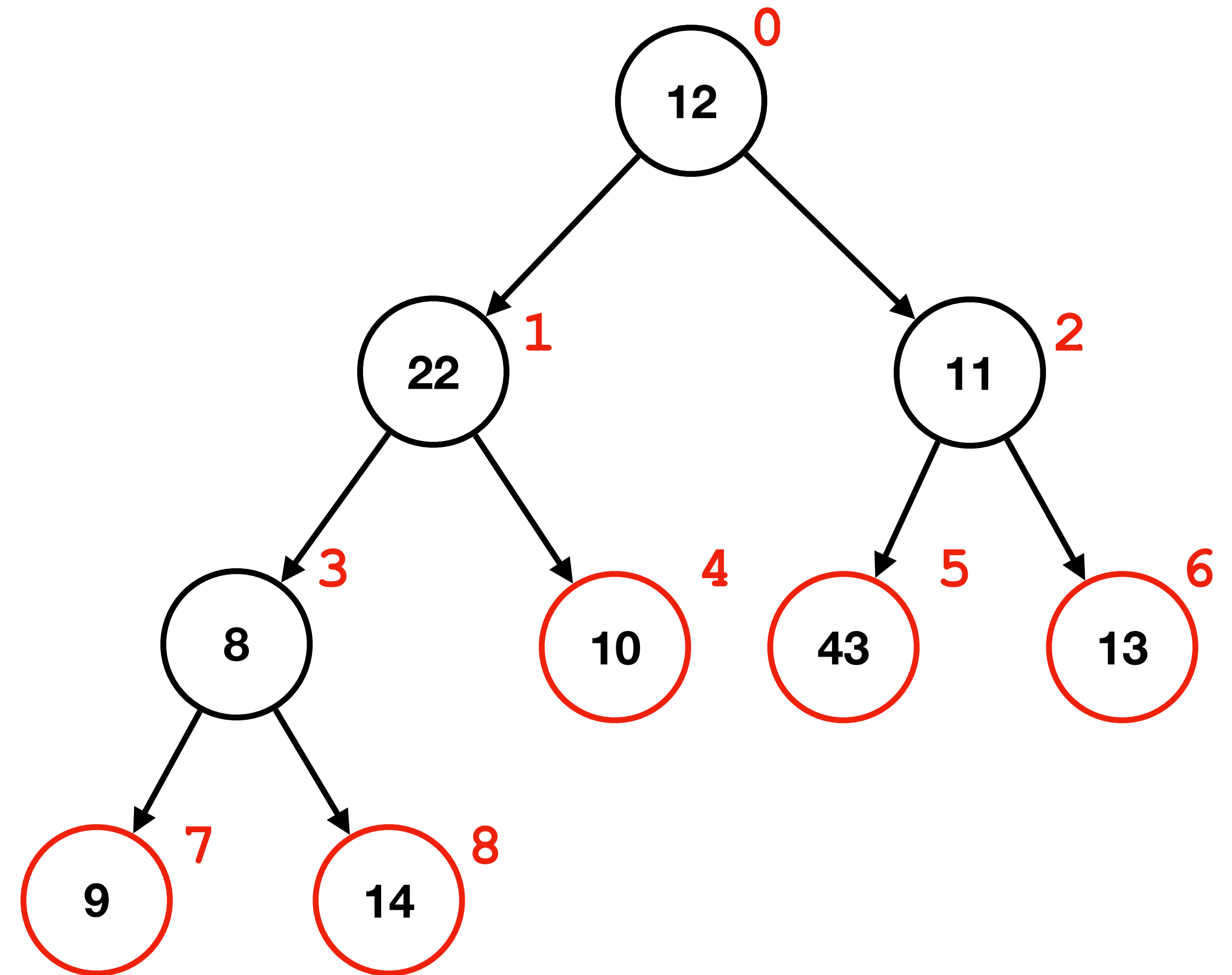
- Given an unsorted array:
12, 22, 11, 8, 10, 43, 13, 9, 14
- What if we just call this a *heap*?
- *Insight:* To make non-leaves satisfy the value property, perform bubble-down on every non-leaf node, from bottom up.
- Bubble down assumes that both subtrees are valid heaps.



Heap

Heapify

- Question: What is the array index of the last (lowest, rightmost) non-leaf node?
- Answer: $\text{heap_size} / 2 - 1$
 - Last leaf is $(\text{heap_size} - 1)$
 - Parent of last leaf is $(\text{heap_size} - 1 - 1) / 2$



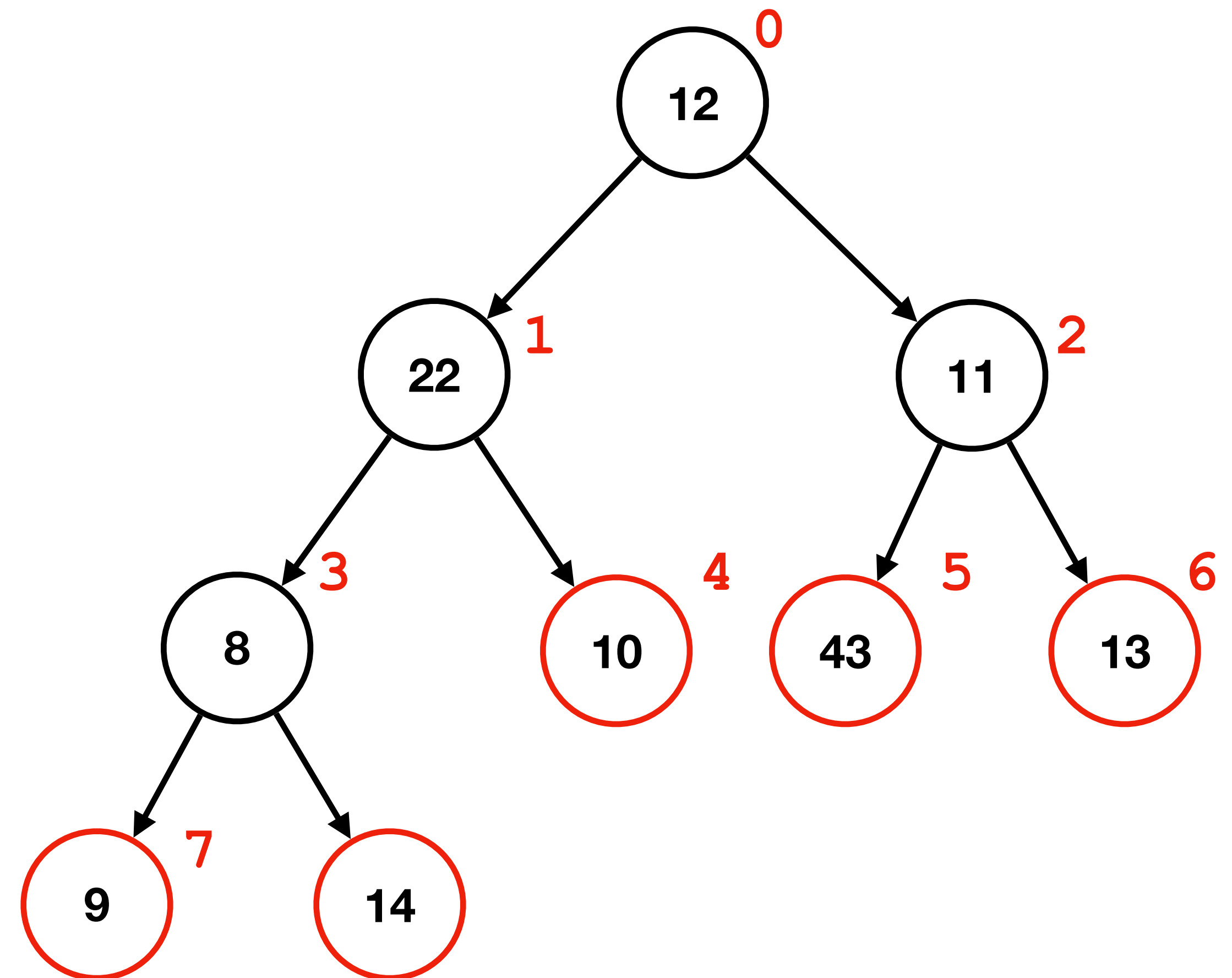
Heap

Heapify

- Given an unsorted array:

12, 22, 11, 8, 10, 43, 13, 9, 14

1. Call this a heap.
2. Starting at index $\text{heap_size} / 2 - 1$ and moving backwards: perform `bubble_down` on every non-leaf node



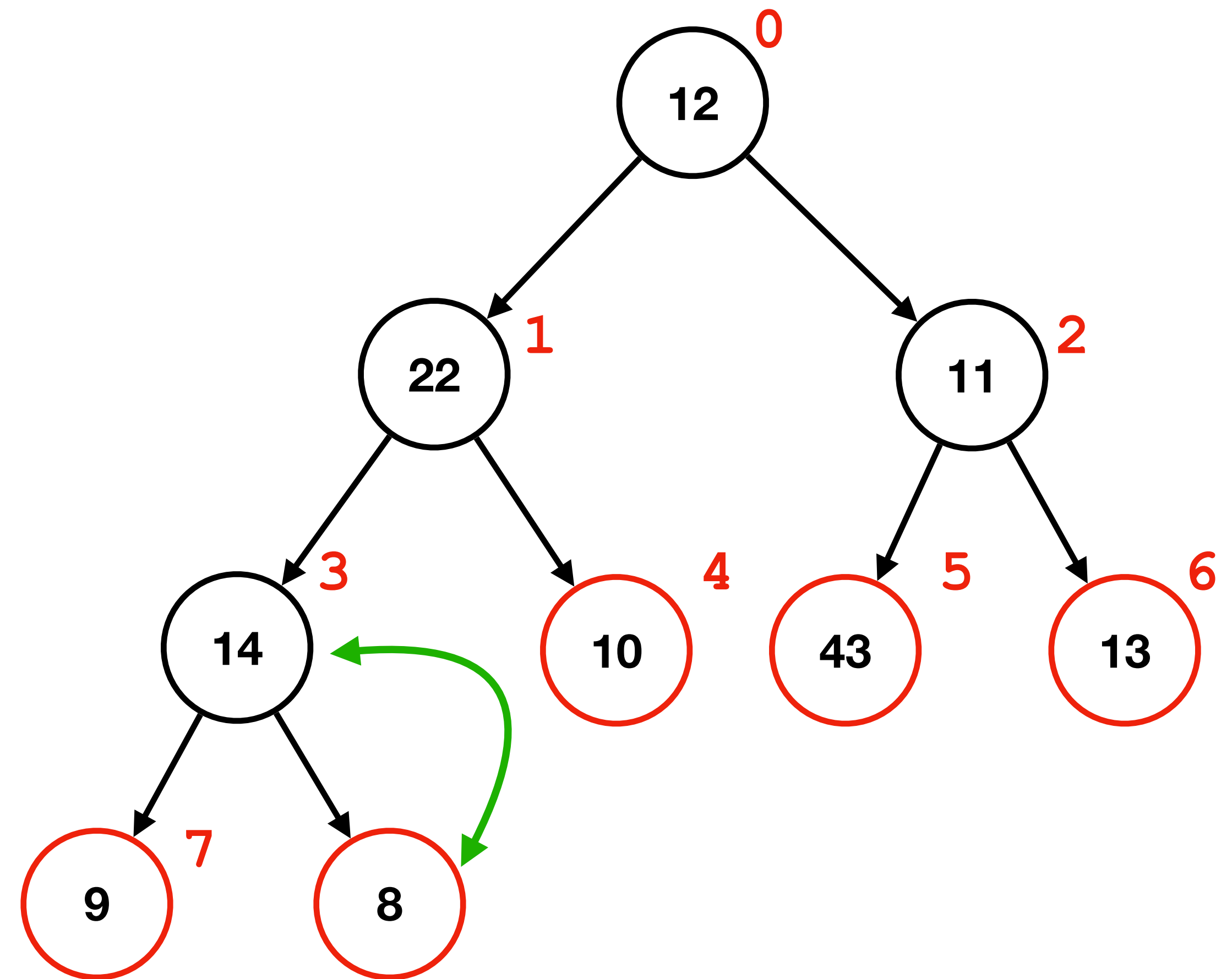
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1. Call this a heap.
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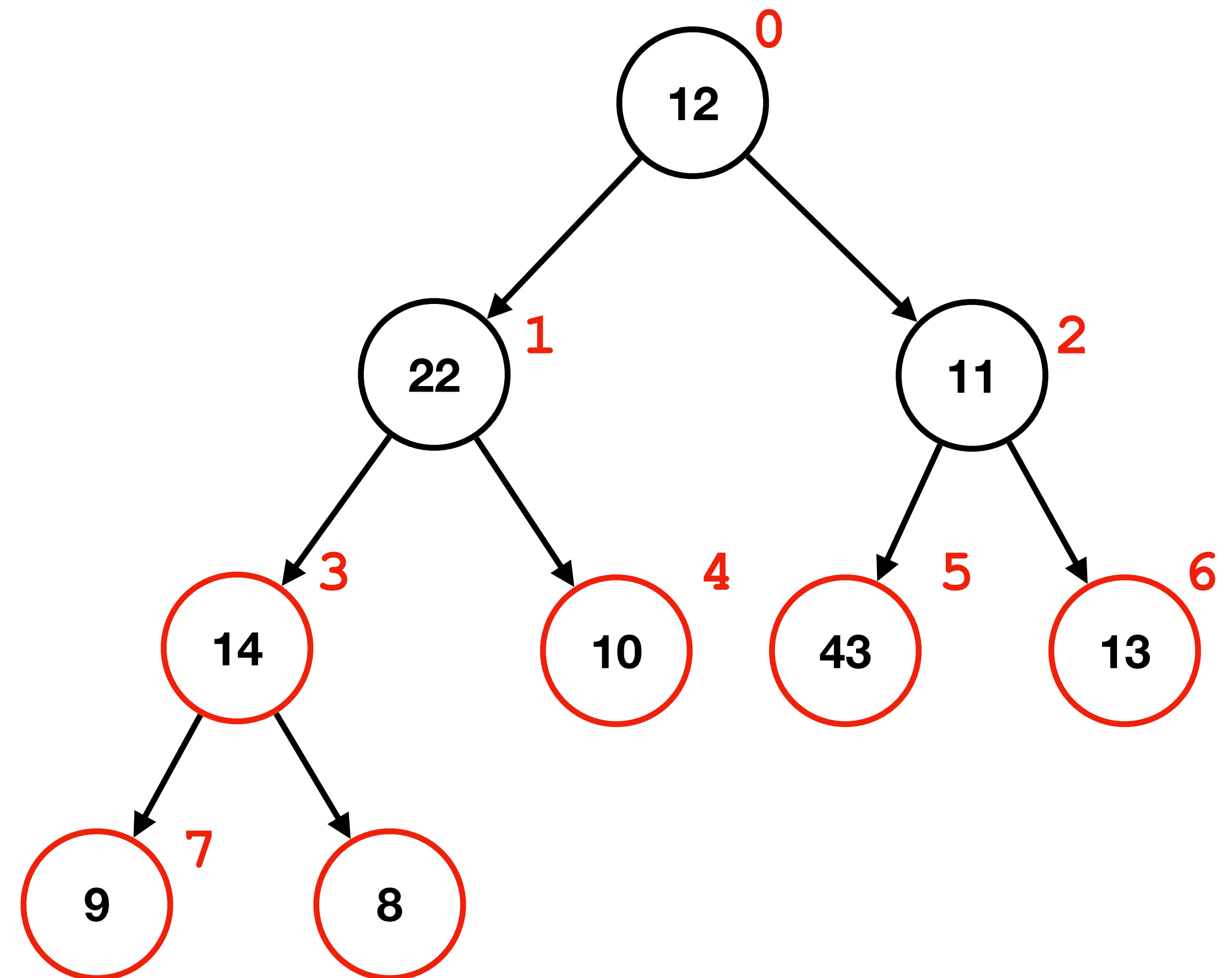
Heap

Heapify

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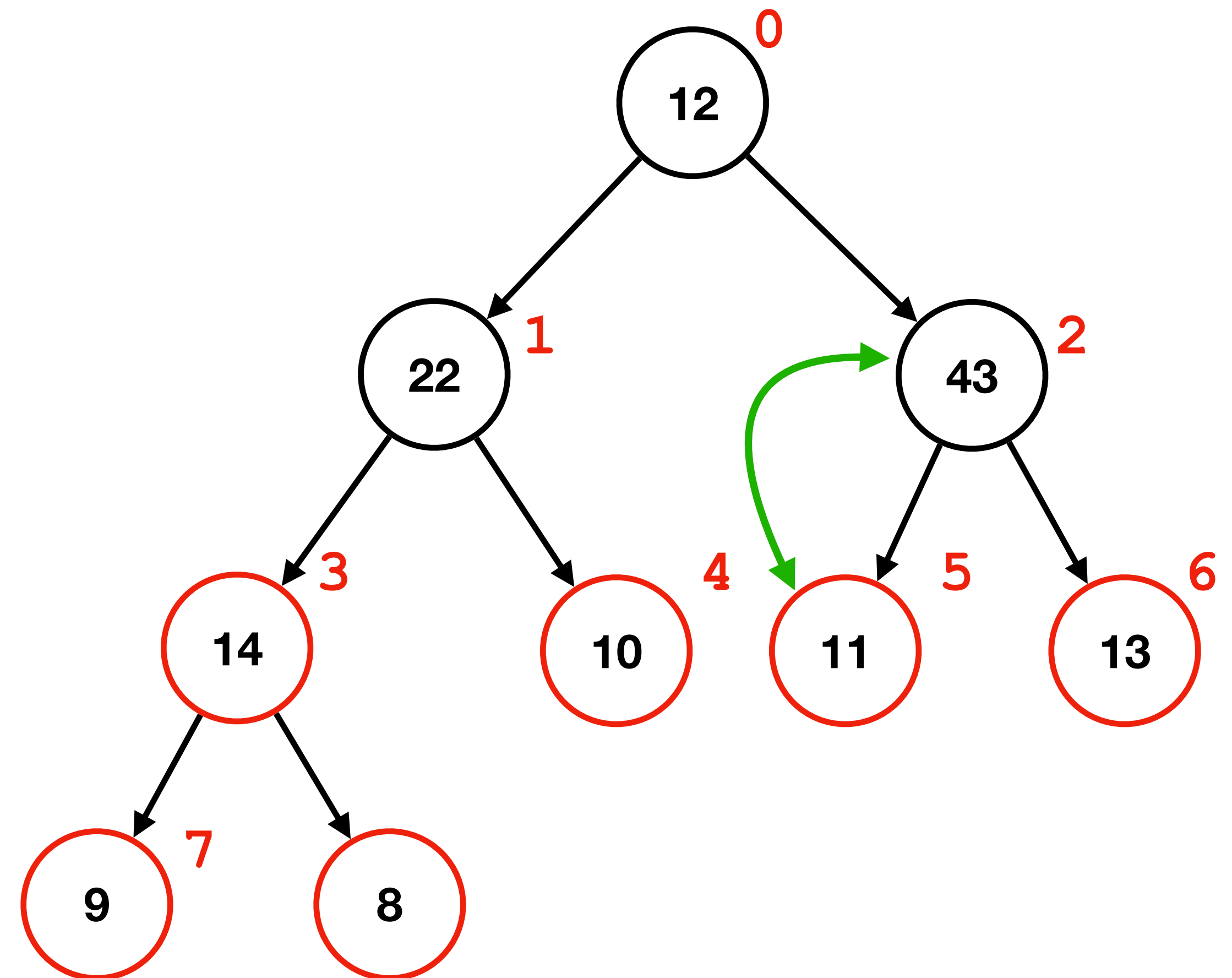
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Heapify

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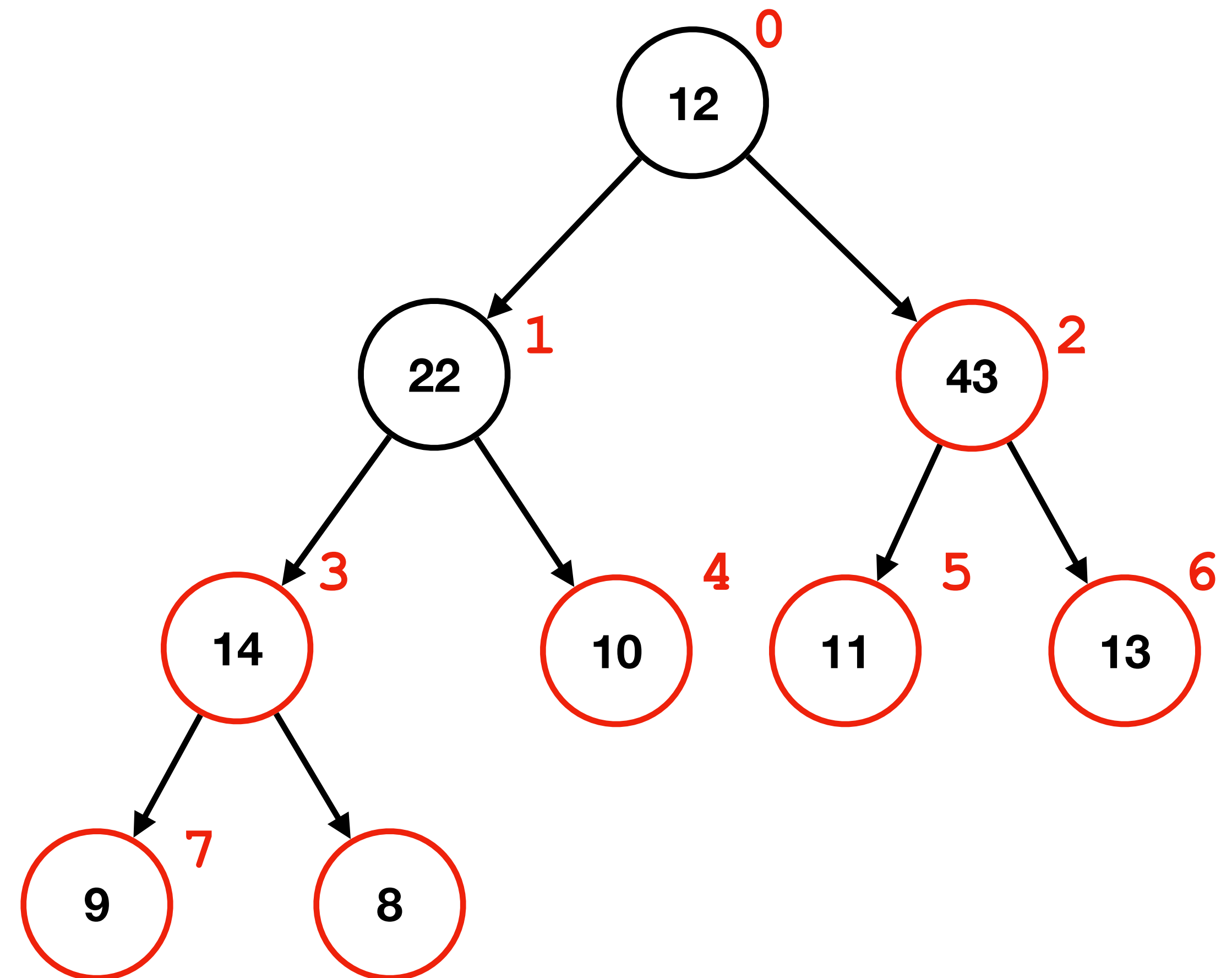
Heap

Heapify

- Given an unsorted array:

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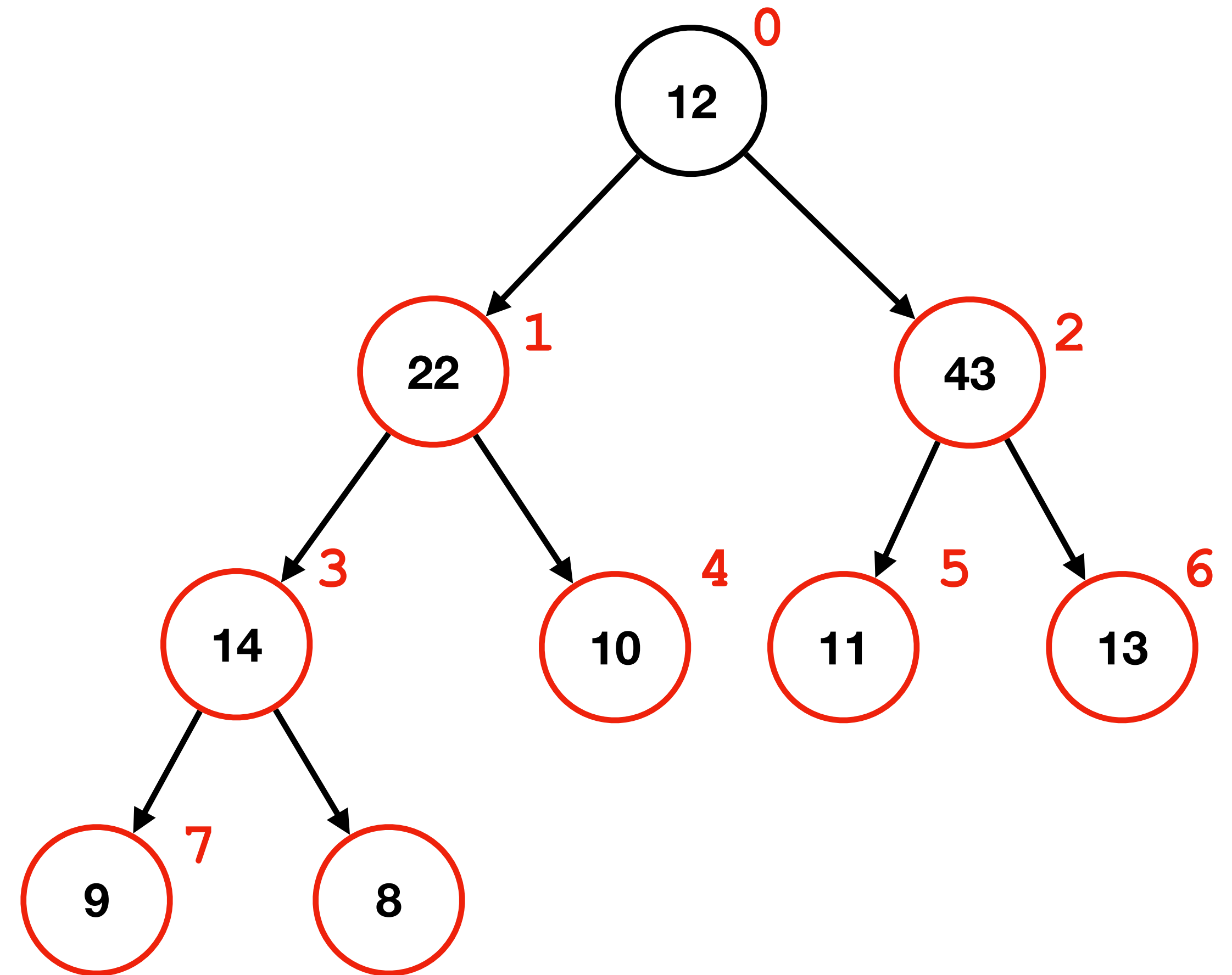
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Heapify

- Given an unsorted array:

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2. Starting at index $\text{heap_size} / 2 - 1$ and moving backwards:
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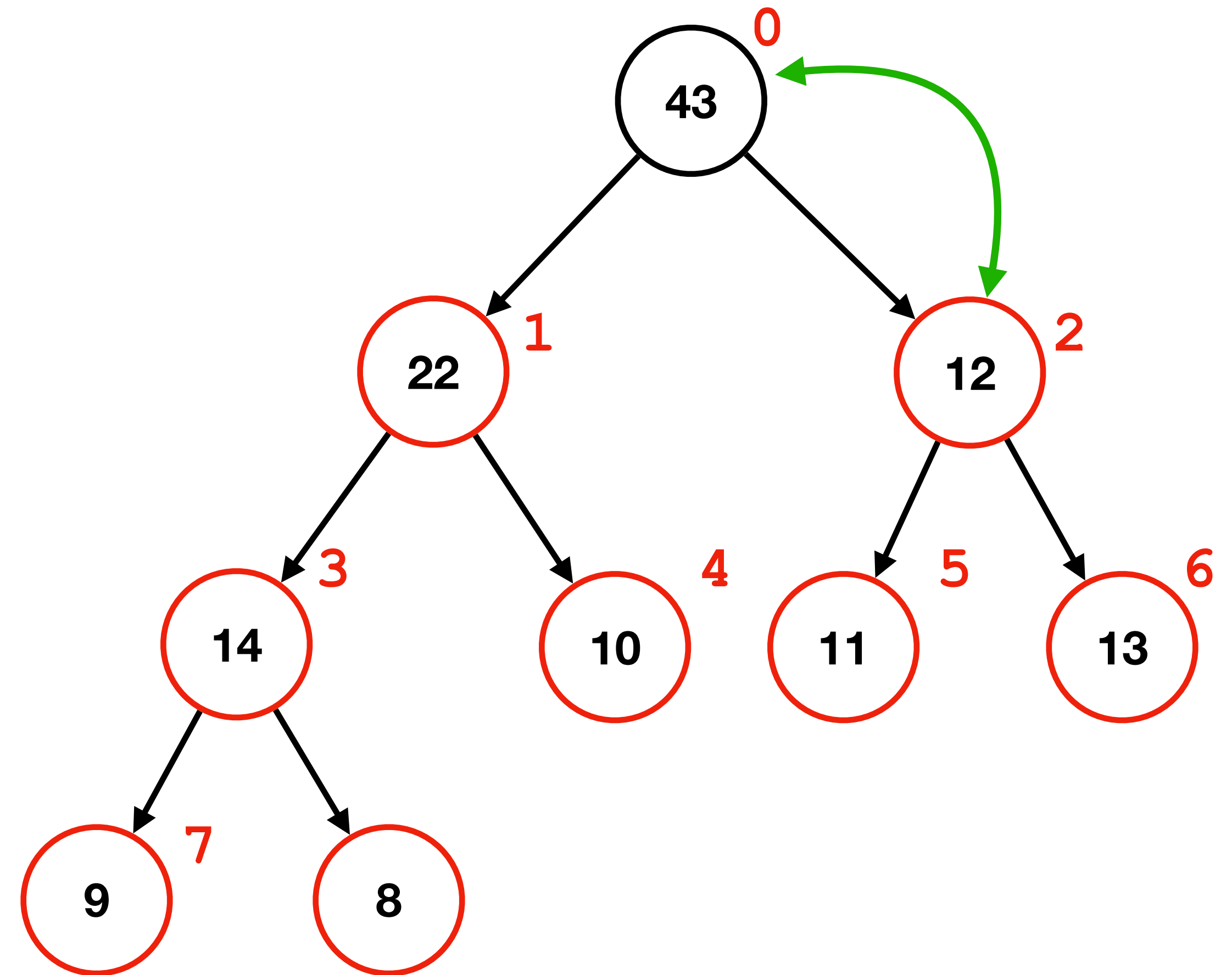
Heap

Heapify

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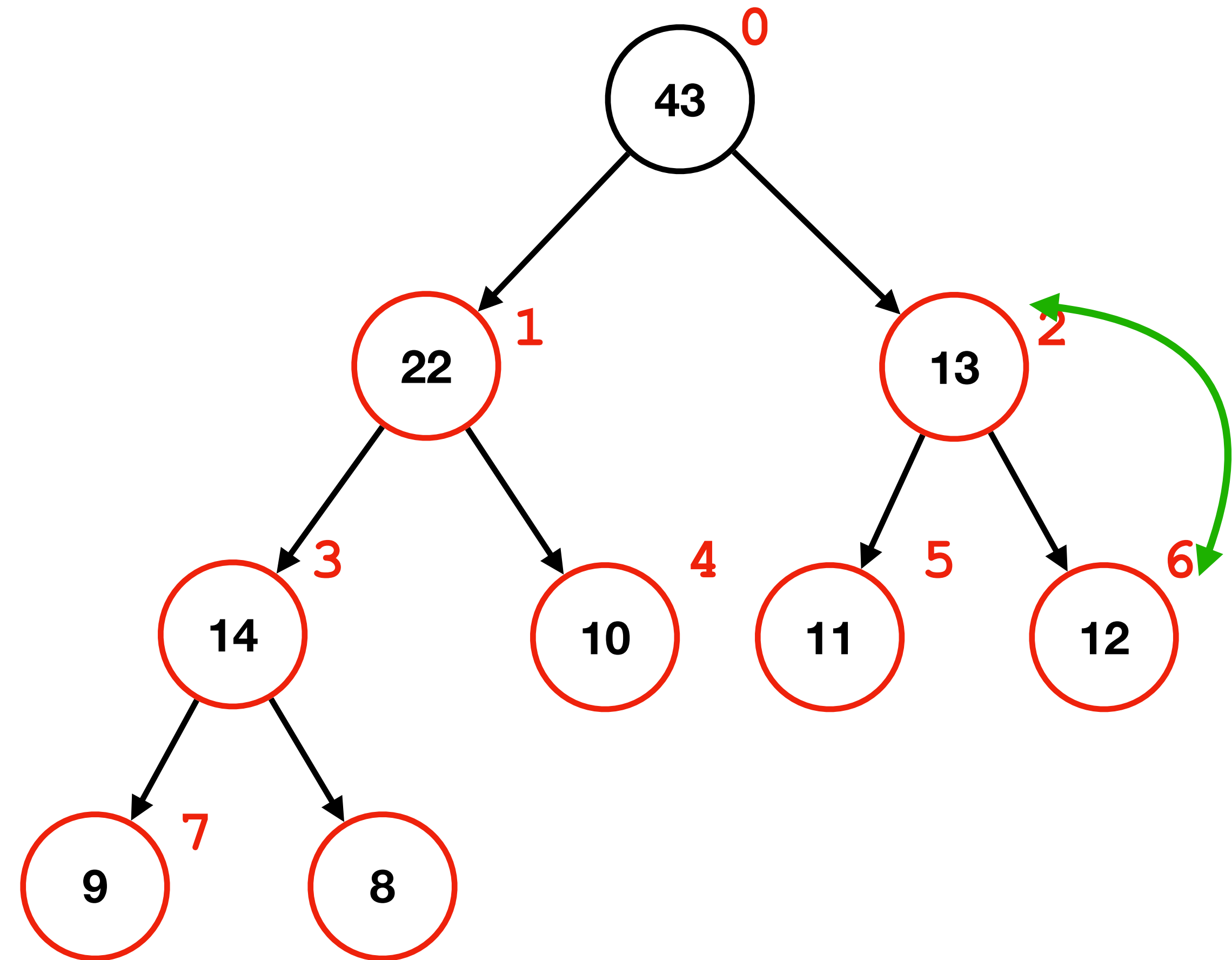
Heap

Heapify

- Given an unsorted array:

12, 22, 11, 8, 10, 43, 13, 9, 14

1. Call this a heap.
2. Starting at index $\text{heap_size} / 2 - 1$ and moving backwards: perform `bubble_down` on every non-leaf node



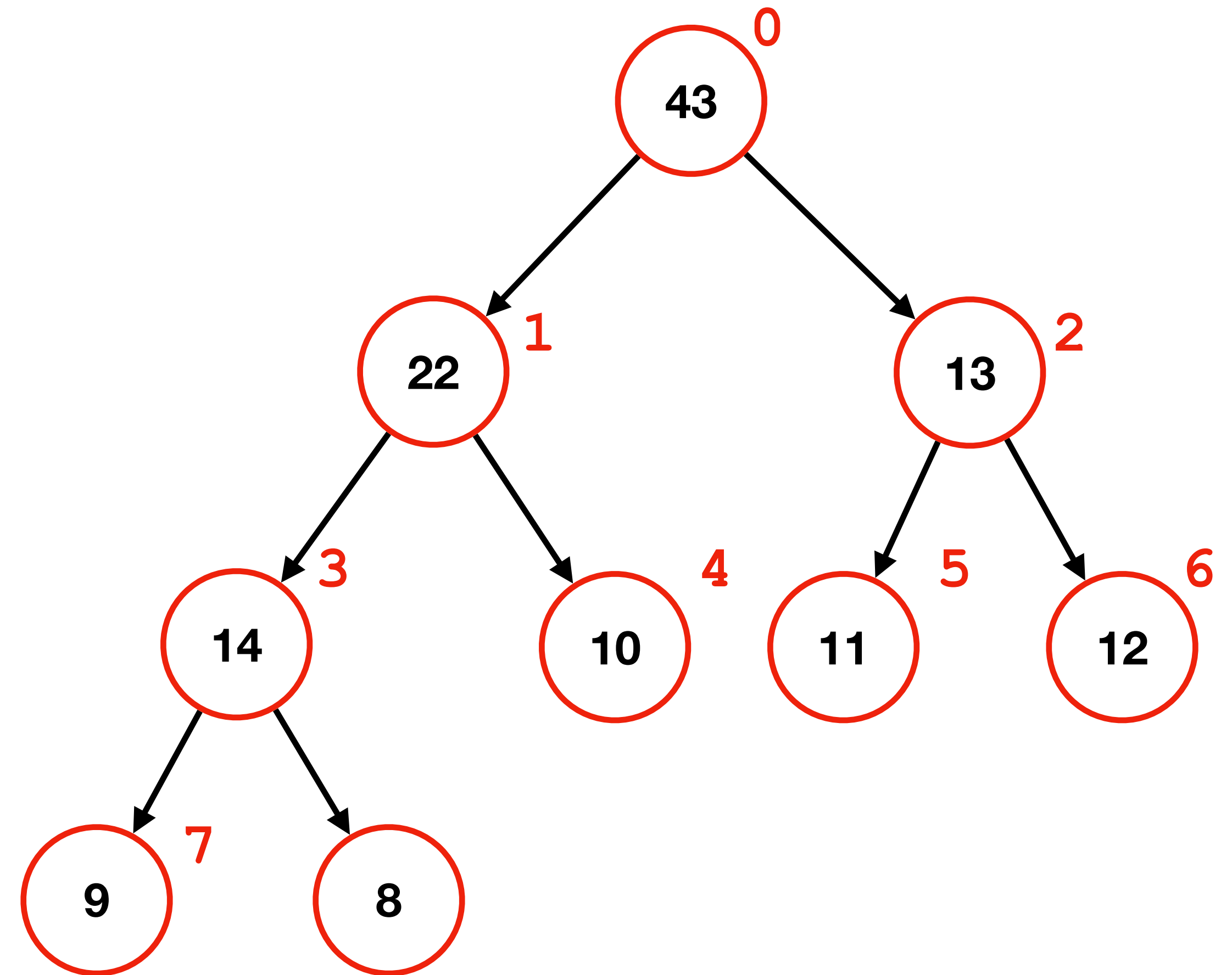
Heap

Heapify

- Given an unsorted array:

12, 22, 11, 8, 10, 43, 13, 9, 14

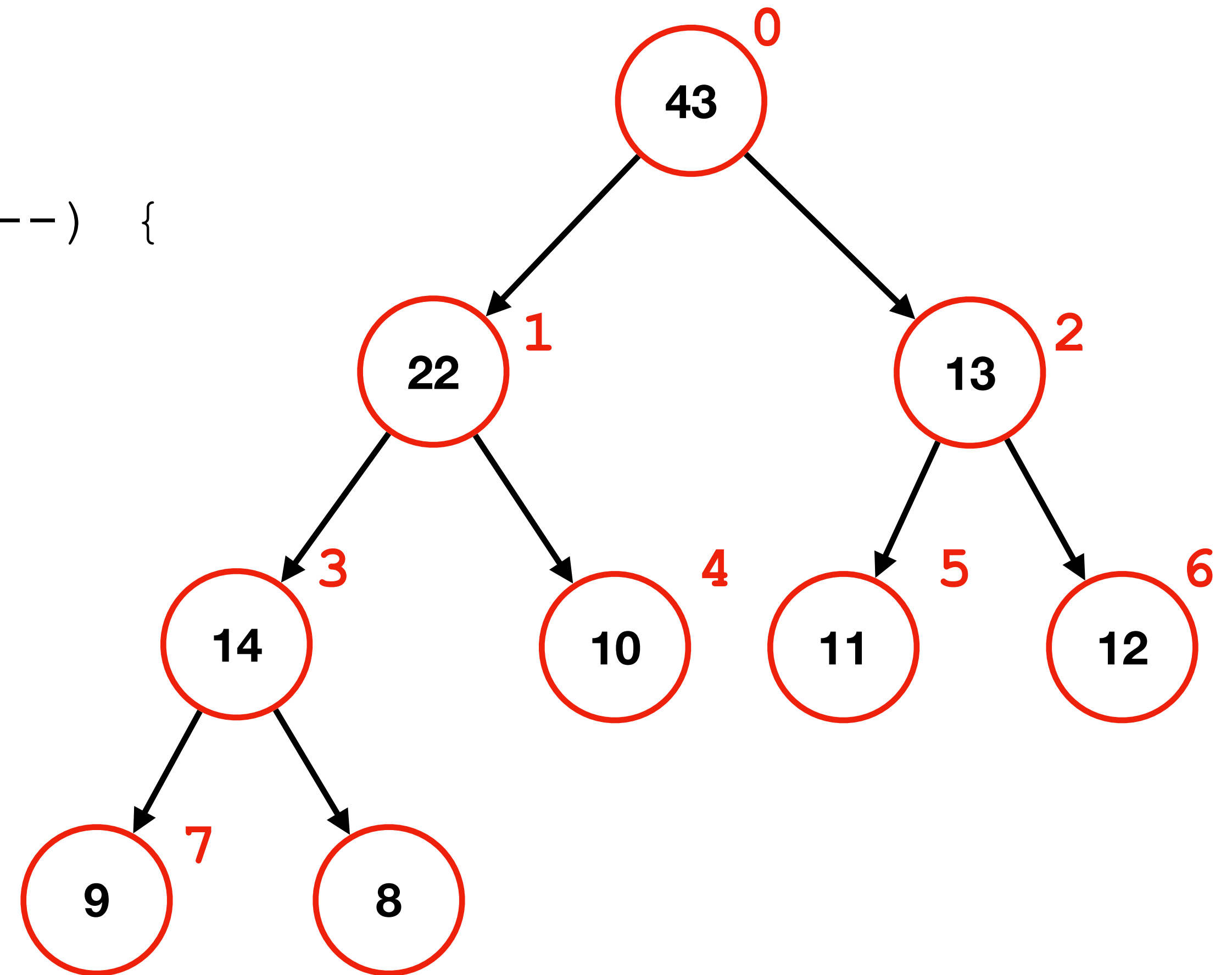
1. Call this a heap.
2. Starting at index $\text{heap_size} / 2 - 1$ and moving backwards:
perform `bubble_down` on every non-leaf node



Heap

Heapify

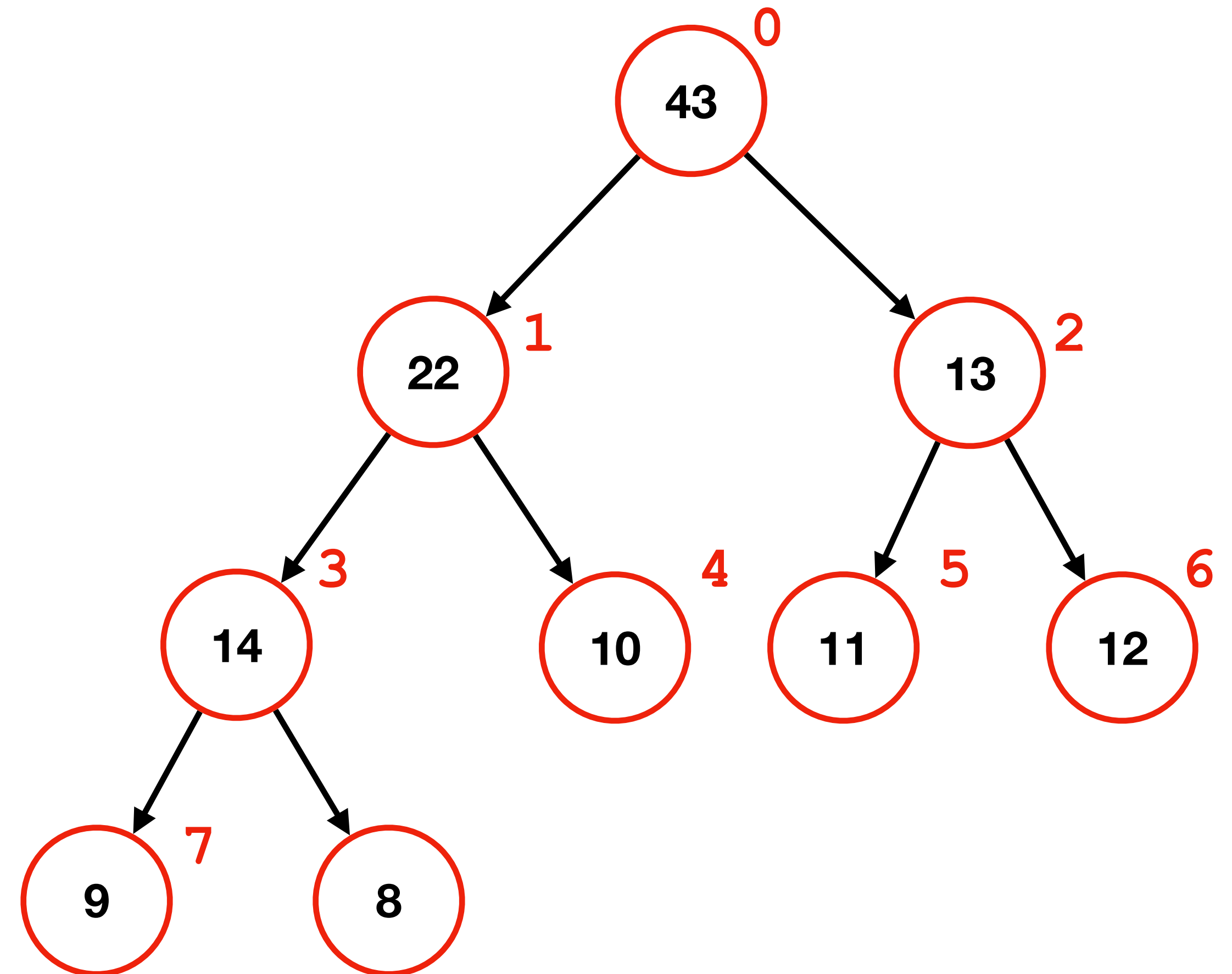
```
void heapify(int *arr, int len)
{
    for (int i = len / 2 - 1; i >= 0; i--) {
        bubble_down(arr, len, i);
    }
}
```



Heap

Heapify Complexity?

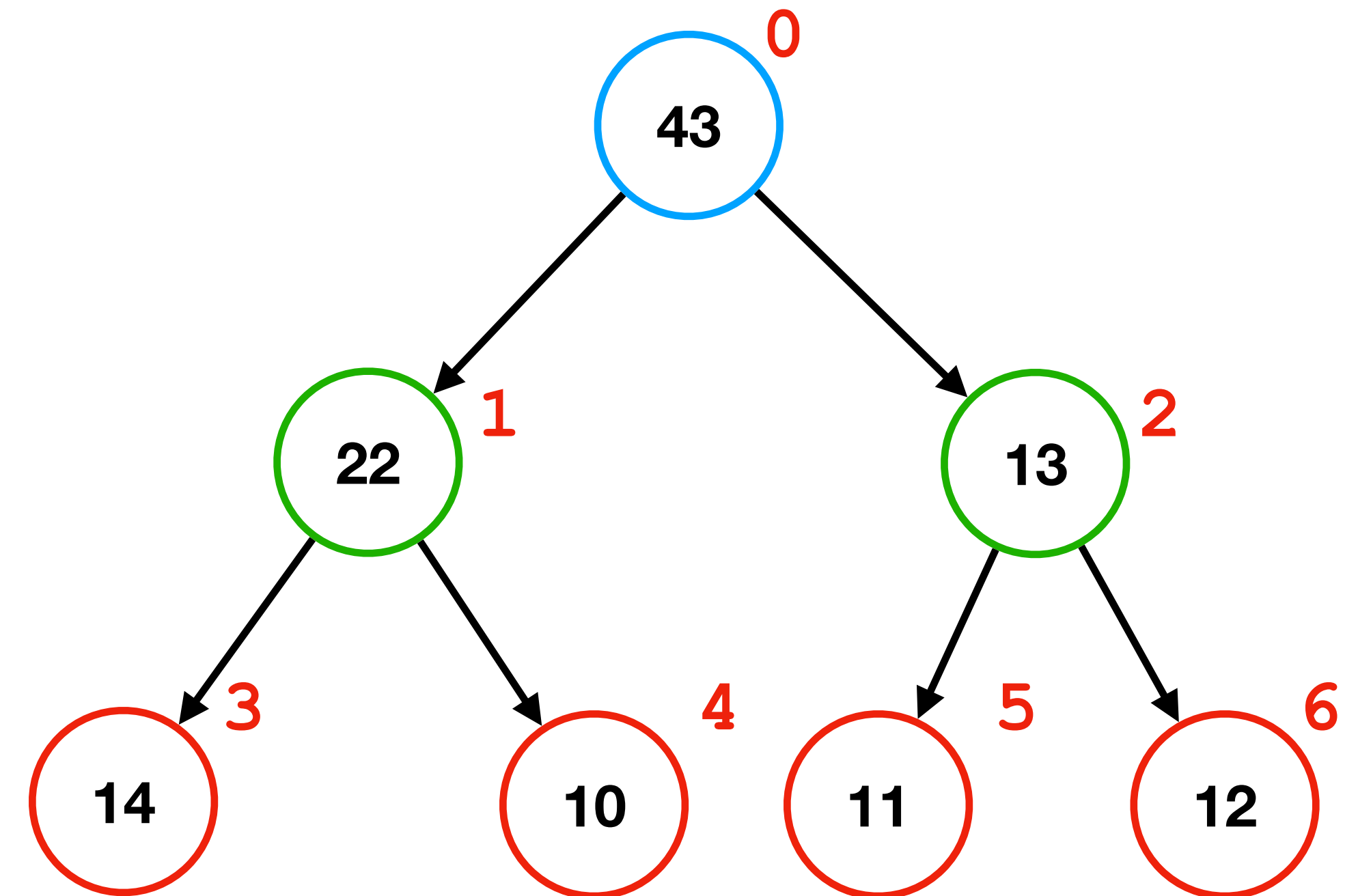
- CMSC 27200.
- Informal analysis:



Heap

Heapify Complexity?

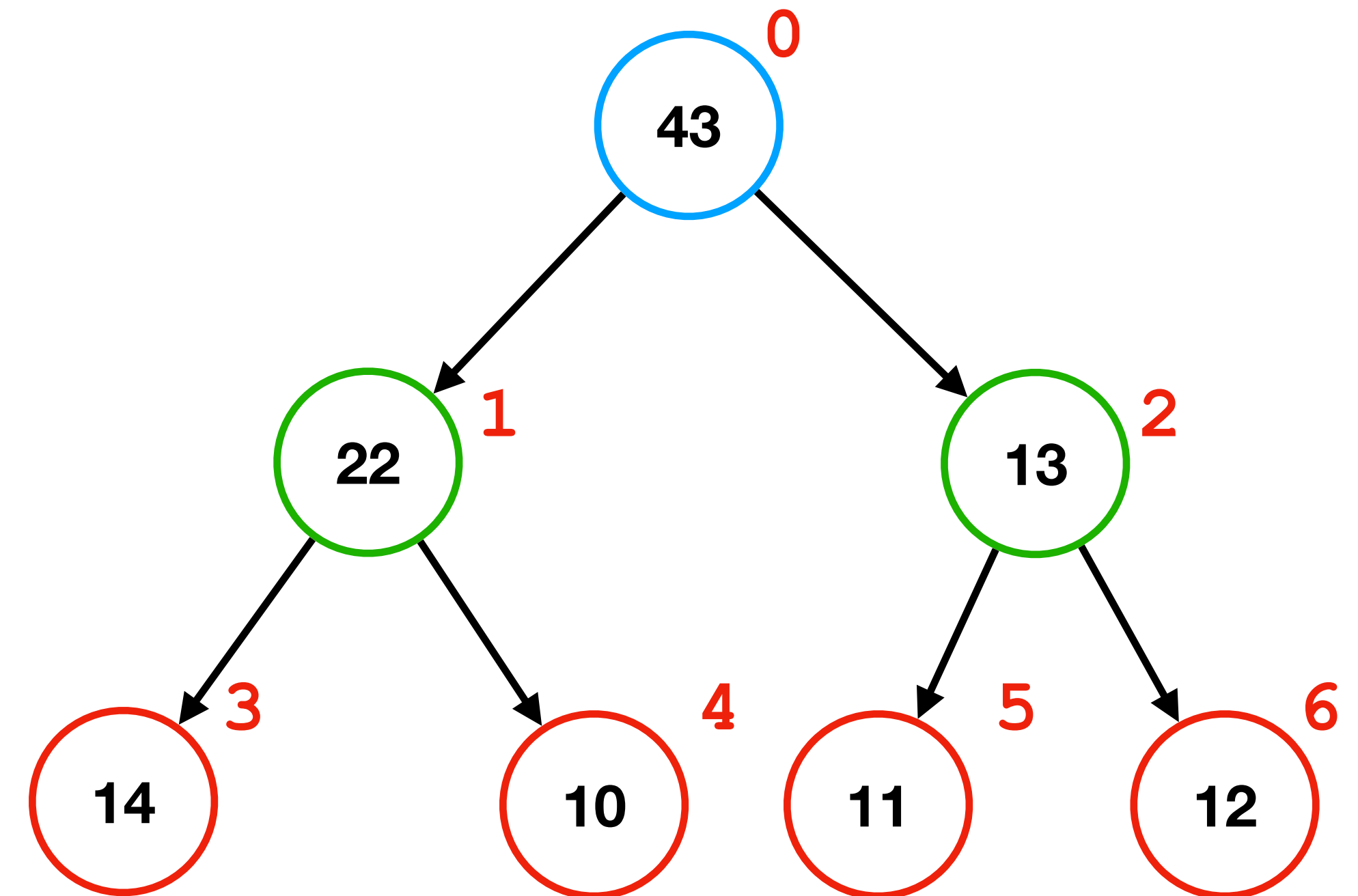
- CMSC 27200.
- Informal analysis:
 - Define level to be the maximum distance from the leaves.
 - red: level 0
 - green: level 1
 - blue: level 2



Heap

Heapify Complexity?

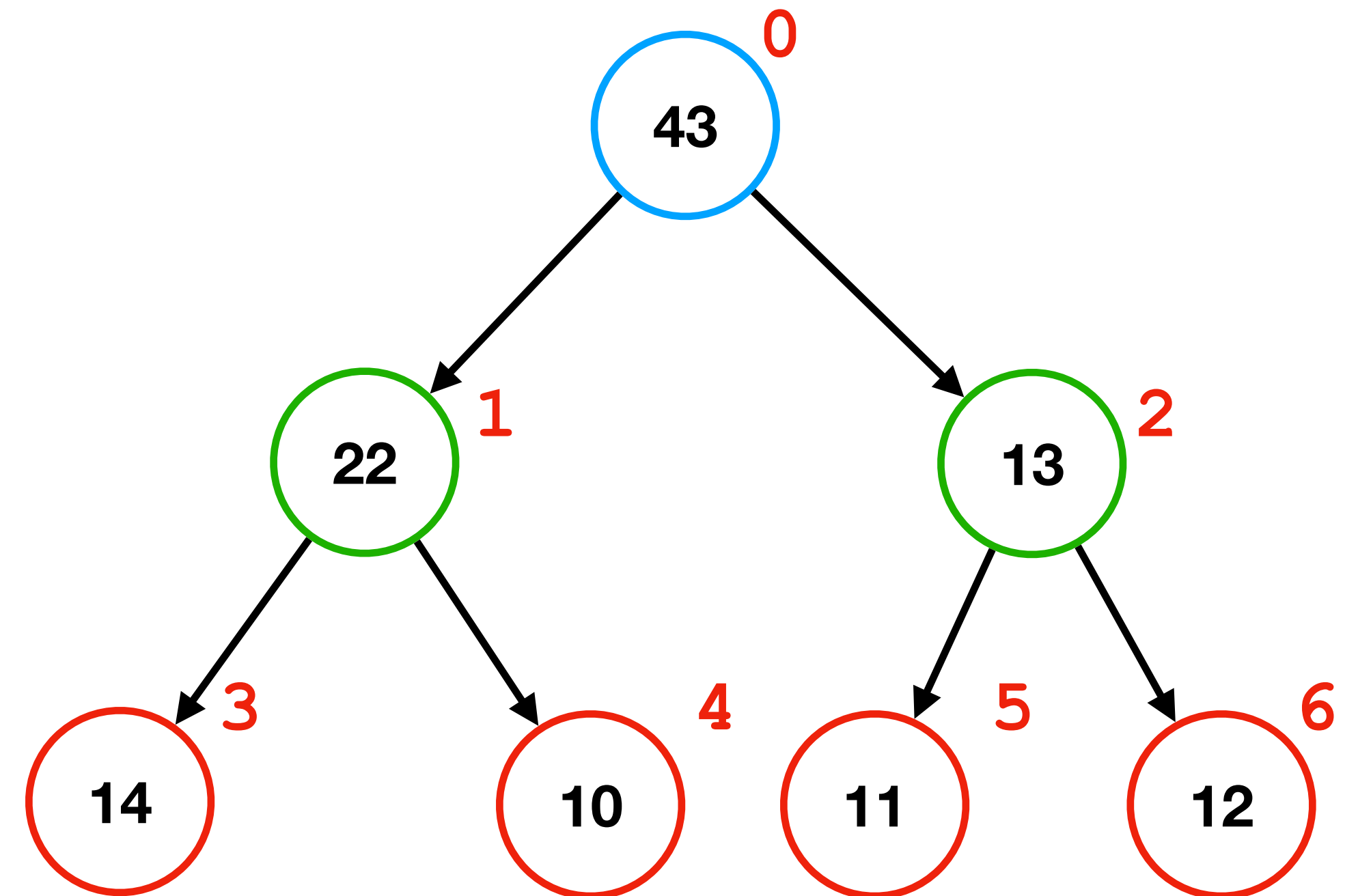
- CMSC 27200.
- Informal analysis:
 - Define *level* to be the maximum distance from the leaves.
 - If n is `heap_size`, there are at most...
 - $\lceil n/2^1 \rceil$ level 0 nodes ($7 / 2 \approx 4$)
 - $\lceil n/2^2 \rceil$ level 1 nodes ($7 / 4 \approx 2$)
 - $\lceil n/2^3 \rceil$ level 2 nodes ($7 / 8 \approx 1$)



Heap

Heapify Complexity?

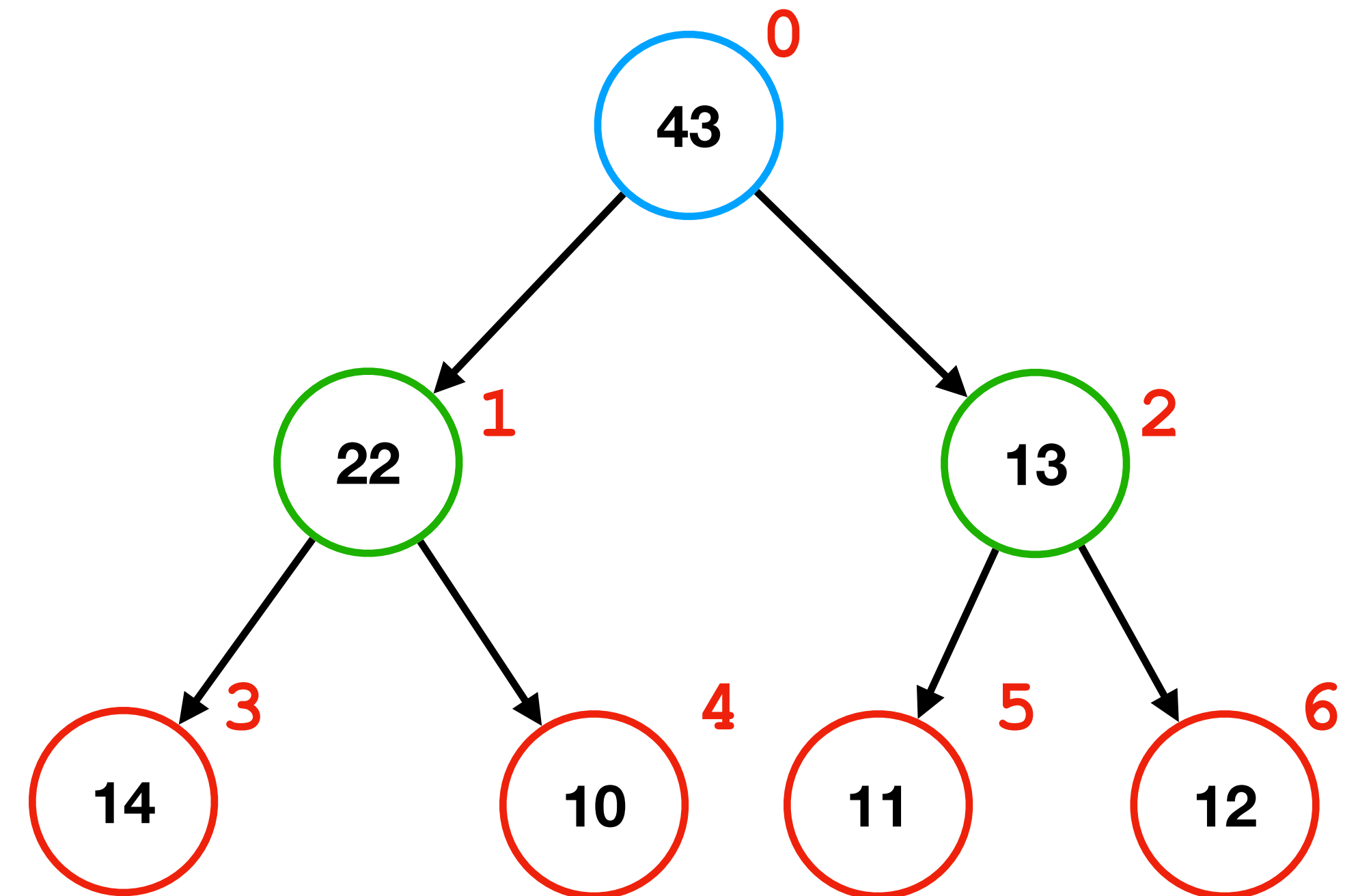
- CMSC 27200.
- Informal analysis:
 - Define level to be the maximum distance from the leaves.
 - If n is `heap_size`, there are at most...
 - $n/2^{l+1}$ nodes for level l



Heap

Heapify Complexity?

- CMSC 27200.
- Informal analysis:
 - Define level to be the maximum distance from the leaves.
 - If n is `heap_size`, there are at most...
 - $n/2^{l+1}$ nodes for level l
 - For nodes with level l , there can be at most l swaps bubbling down.

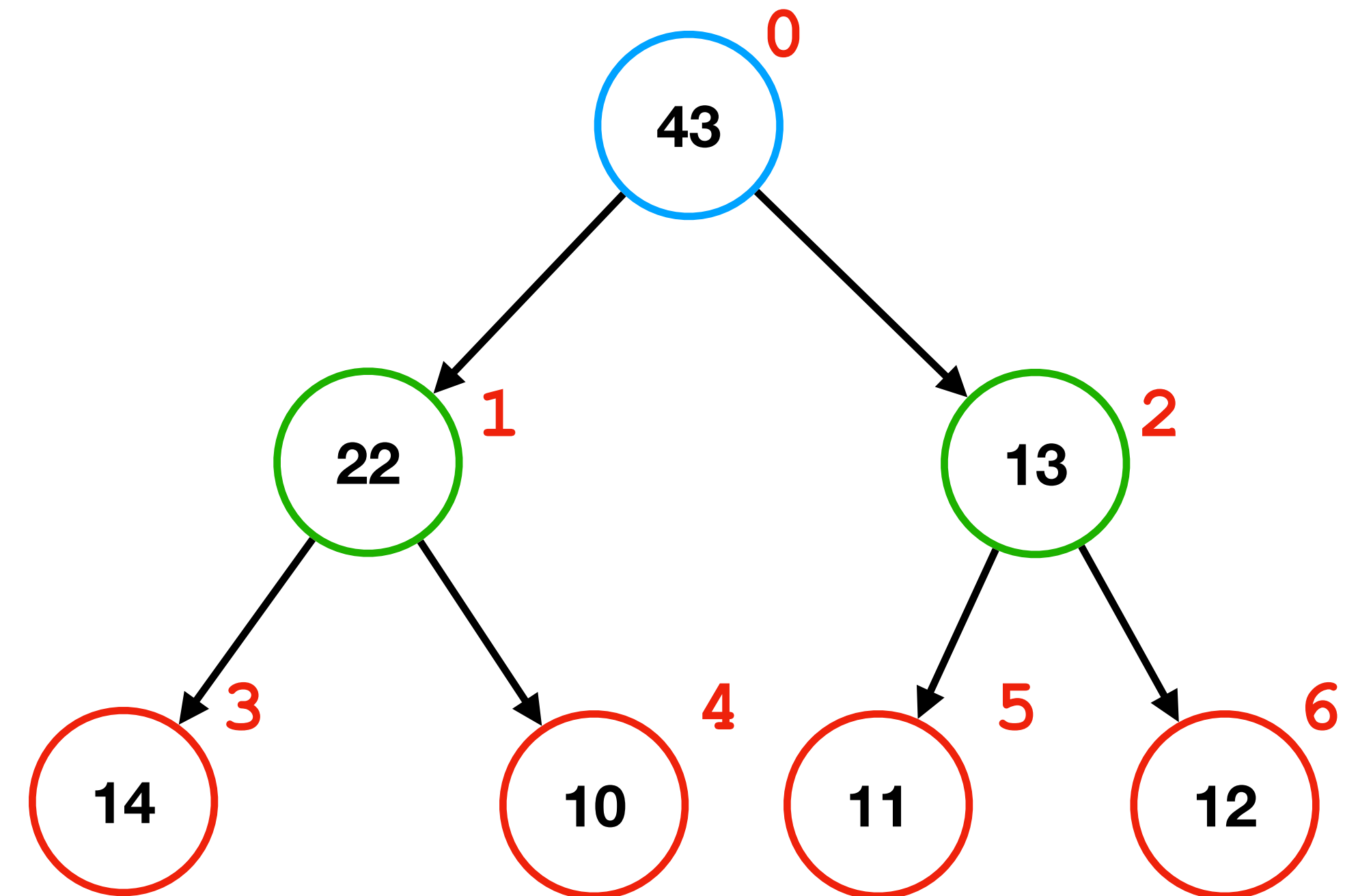


Heap

Heapify Complexity?

- CMSC 27200.
- Informal analysis:

- Total works: $\sum_{l=0}^{\log n} \frac{n}{2^{l+1}} \cdot l$
- $n \left(\sum_{l=0}^{\log n} \frac{l}{2^{l+1}} \right)$
- $\sum_{l=0}^{\log n} \frac{l}{2^{l+1}} < \sum_{l=0}^{\infty} \frac{l}{2^{l+1}} = 1$



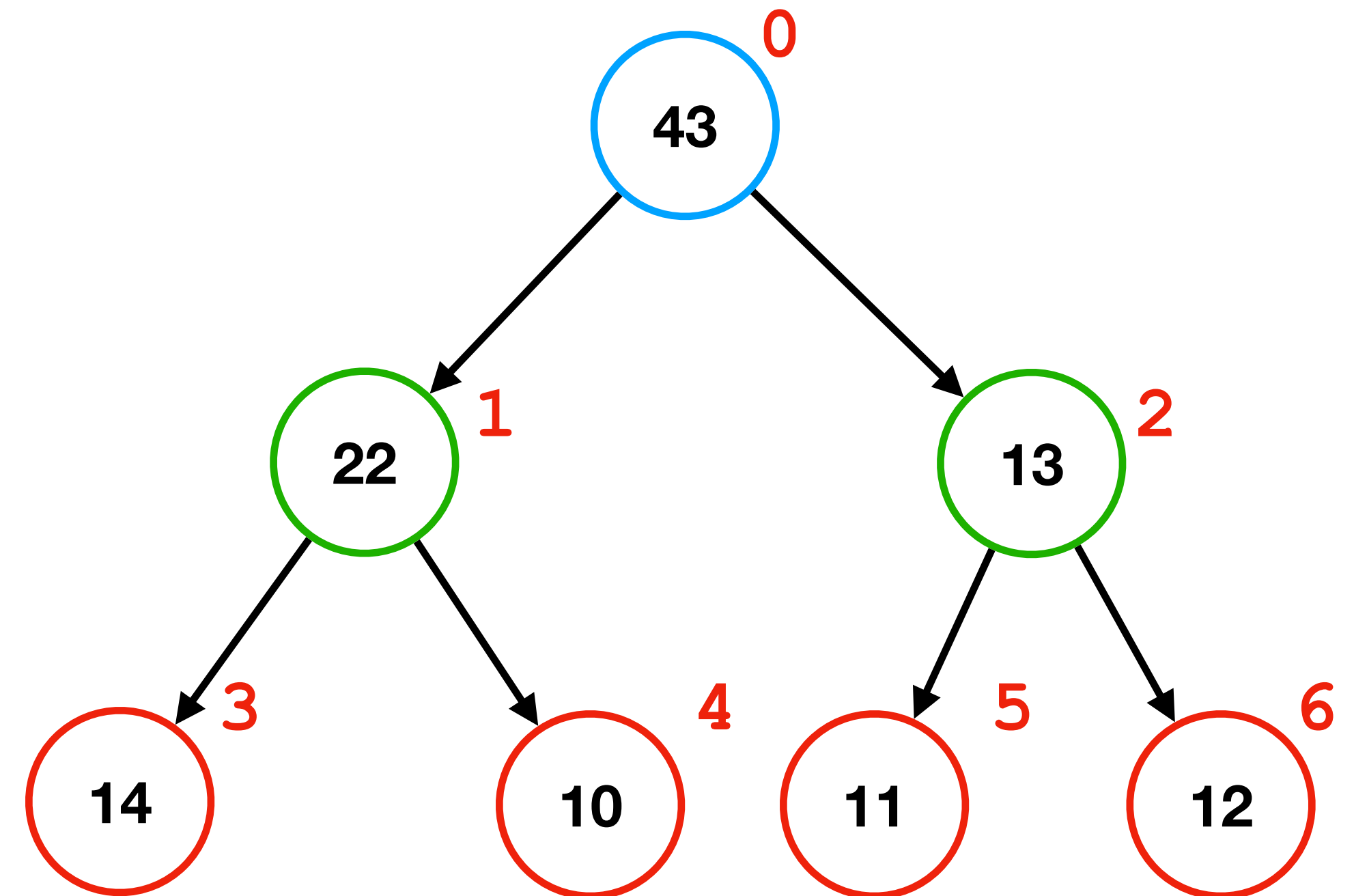
Heap

Heapify Complexity?

- CMSC 27200.
- Informal analysis:

- Total works: $\sum_{l=0}^{\log n} \frac{n}{2^{l+1}} \cdot l < n = O(n)$

- Magic!



Heap

Heap Sort

- What is the best way to build a heap from scratch?

12, 22, 11, 8, 10, 43, 13, 9, 14

- Heapify -- $O(n)$
- `remove_top` and put it to the end

Heap

Heap Sort

```
int remove_top(int *arr, int len)
{
    int top = arr[0];
    arr[0] = arr[len - 1];

    bubble_down(arr, len - 1, 0);

    return top;
}
```

```
for (int i = len - 1; i >= 1; i--) {
    swap(arr, 0, i);
    bubble_down(arr, i, 0);
}
```

Heap

Heap Sort

- What is the best way to build a heap from scratch?

12, 22, 11, 8, 10, 43, 13, 9, 14

- Heapify -- $O(n)$
- For each n :
 - `remove_top` and put it to the end $O(\log n)$
- Complexity: $O(n \log n)$

Heap

Heap Sort Code

```
void heap_sort(int *arr, int len)
{
    for (int i = len / 2 - 1; i >= 0; i--) {
        bubble_down(arr, len, i);
    }

    for (int i = len - 1; i >= 1; i--) {
        swap(arr, 0, i);
        bubble_down(arr, i, 0);
    }
}
```

Heapify

Extract top and put at the end

Heap

Heap Sort

- What is the best way to build a heap from scratch?

12, 22, 11, 8, 10, 43, 13, 9, 14

- Heapify -- $O(n)$
- For each n :
 - `remove_top` and put it to the end $O(\log n)$
- Complexity: $O(n \log n)$
- Space complexity: in-place

Sorting

- $O(n^2)$: Selection, Insertion, Bubble
- $O(n \log n)$: Tree, Merge, Quick
- $O(n \log n)$ without extra space (not even a stack): Heap sort
 - Heap sort is "selection sort with the right data structure."

Sorting

Links

- Visualization of heaps: <https://www.cs.usfca.edu/~galles/visualization/Heap.html>
- Dances:
 - Merge sort: https://youtu.be/XaqR3G_NVoo
 - Quick sort: <https://youtu.be/ywWBy6J5gz8>
- Sorting algorithms: <https://youtu.be/kPRA0W1kECg>

std::stable_sort (gcc) - 8950 comparisons, 20268 array accesses, 1.00 ms delay

<http://panthema.net/2013/sound-of-sorting>

