

CSCI 232:

Data Structures and Algorithms

Red Black Trees

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Spring 2025

Announcements

Quiz on Monday (no lecture)

- Taken online via Canvas
- Opens at 6 AM, closes at 11:59 PM
- Not timed, but you only have one attempt

20-ish Questions

- Short Answer
- Multiple Choice
- True/False

Quiz Topics

- Linked Lists, Arrays
- Trees
- Binary Search Trees
- Red Black Trees
- Heaps

Binary Search Tree Running Times

(If we have a way to ensure the BST is balanced)

Operation	Running Time
Insertion	$O(\log n)$
Removal	$O(\log n)$
Searching	$O(\log n)$
Printing	$O(n)$

$n = \#$ of nodes

Binary Search Tree Running Times

(If we have a way to ensure the BST is balanced)

Operation	Running Time
Insertion	$O(\log n)$
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Searching	$O(\log n)$
Printing	$O(n)$

$n = \#$ of nodes

Sorted Array

Operation	Running Time
Insertion	$O(n)$
Removal	$O(n)$
Searching	$O(\log n)$
Printing	$O(n)$

LinkedList

Operation	Running Time
Insertion	$O(1)$
Removal (by element)	$O(n)$
Searching	$O(n)$
Printing	$O(n)$

Binary Search Tree Running Times

(If we have a way to ensure the BST is balanced)

Operation	Running Time
Insertion	$O(\log n)$
Removal (by element)	$O(\log n)$
Searching	$O(\log n)$
Printing	$O(n)$

$n = \#$ of nodes

Inserting/removal in a BST is faster than inserting into a sorted Array

Sorted Array

Operation	Running Time
Insertion	$O(n)$ (<i>shifting elements</i>)
Removal (by element)	$O(n)$ (<i>shifting elements</i>)
Searching	$O(\log n)$ (<i>binary search</i>)
Printing	$O(n)$

LinkedList

Operation	Running Time
Insertion	$O(1)$
Removal (by element)	$O(n)$
Searching	$O(n)$
Printing	$O(n)$

Binary Search Tree Running Times

(If we have a way to ensure the BST is balanced)

Operation	Running Time
Insertion	$O(\log n)$
Removal (by element)	$O(\log n)$
Searching	$O(\log n)$
Printing	$O(n)$

$n = \#$ of nodes

While LinkedLists provide faster insertion times, navigating a Binary Search Tree is faster than a Linked List

(We don't really have a way to start at the "middle" node of a linked and do binary search)

Sorted Array

Operation	Running Time
Insertion	$O(n)$
Removal (by element)	$O(n)$
Searching	$O(\log n)$
Printing	$O(n)$

LinkedList

Operation	Running Time
Insertion	$O(1)$
Removal (by element)	$O(n)$ (<i>linear search</i>)
Searching	$O(n)$ (<i>linear search</i>)
Printing	$O(n)$

Binary Search Tree Running Times

(If we have a way to ensure the BST is balanced)

Operation	Running Time
Insertion	$O(\log n)$
Removal (by element)	$O(\log n)$
Searching	$O(\log n)$
Printing	$O(n)$

$n = \#$ of nodes

Which is the best tool for the job?

Depends on what you need!

Sorted Array

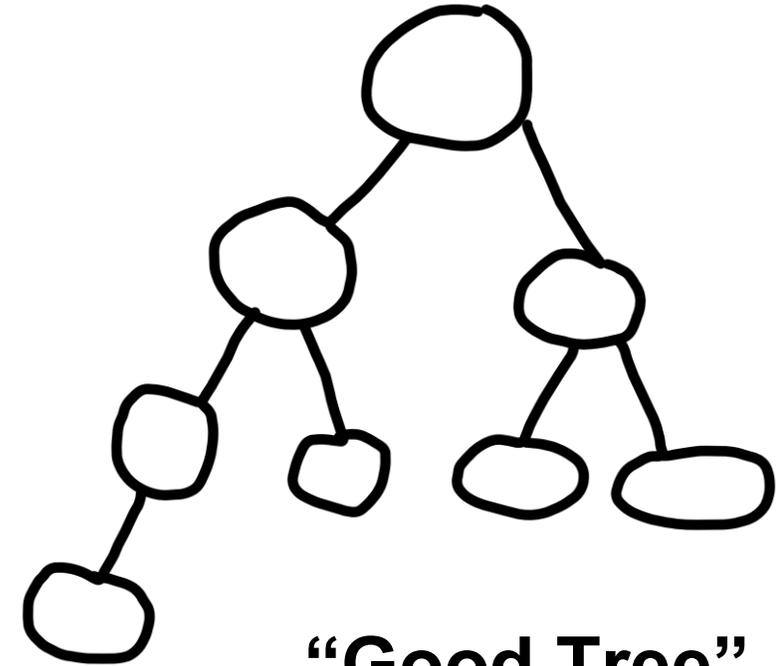
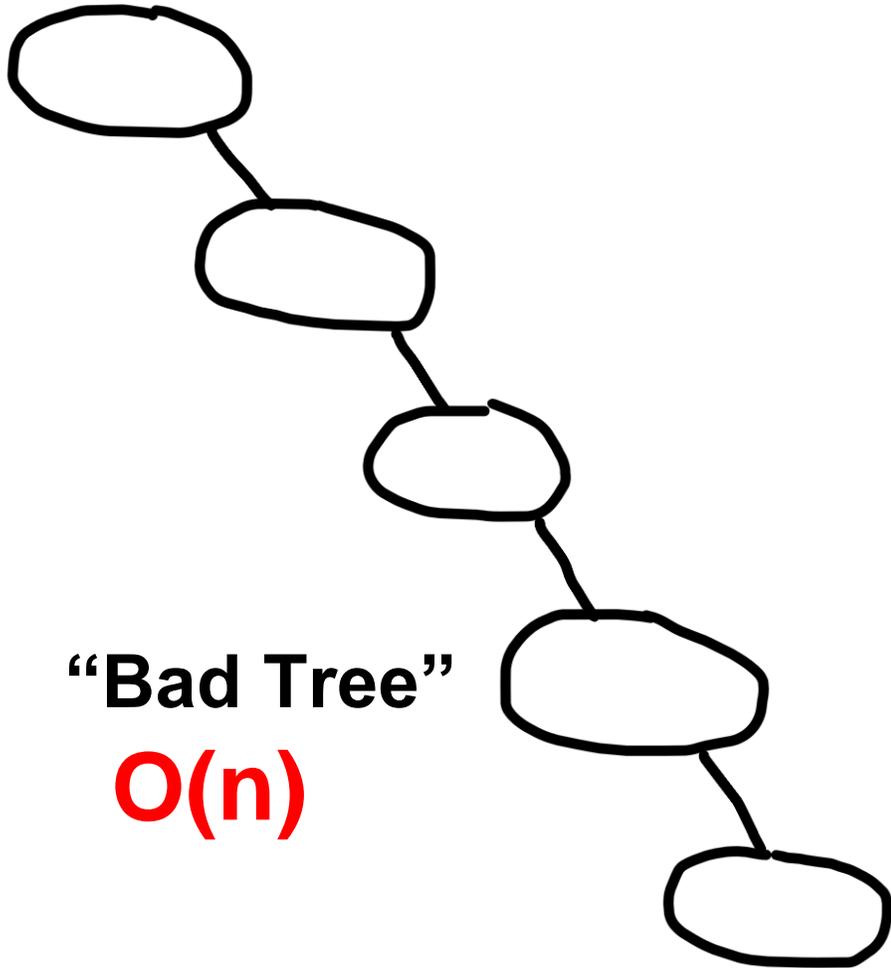
Operation	Running Time
Insertion	$O(n)$
Removal (by element)	$O(n)$
Searching	$O(\log n)$
Printing	$O(n)$

LinkedList

Operation	Running Time
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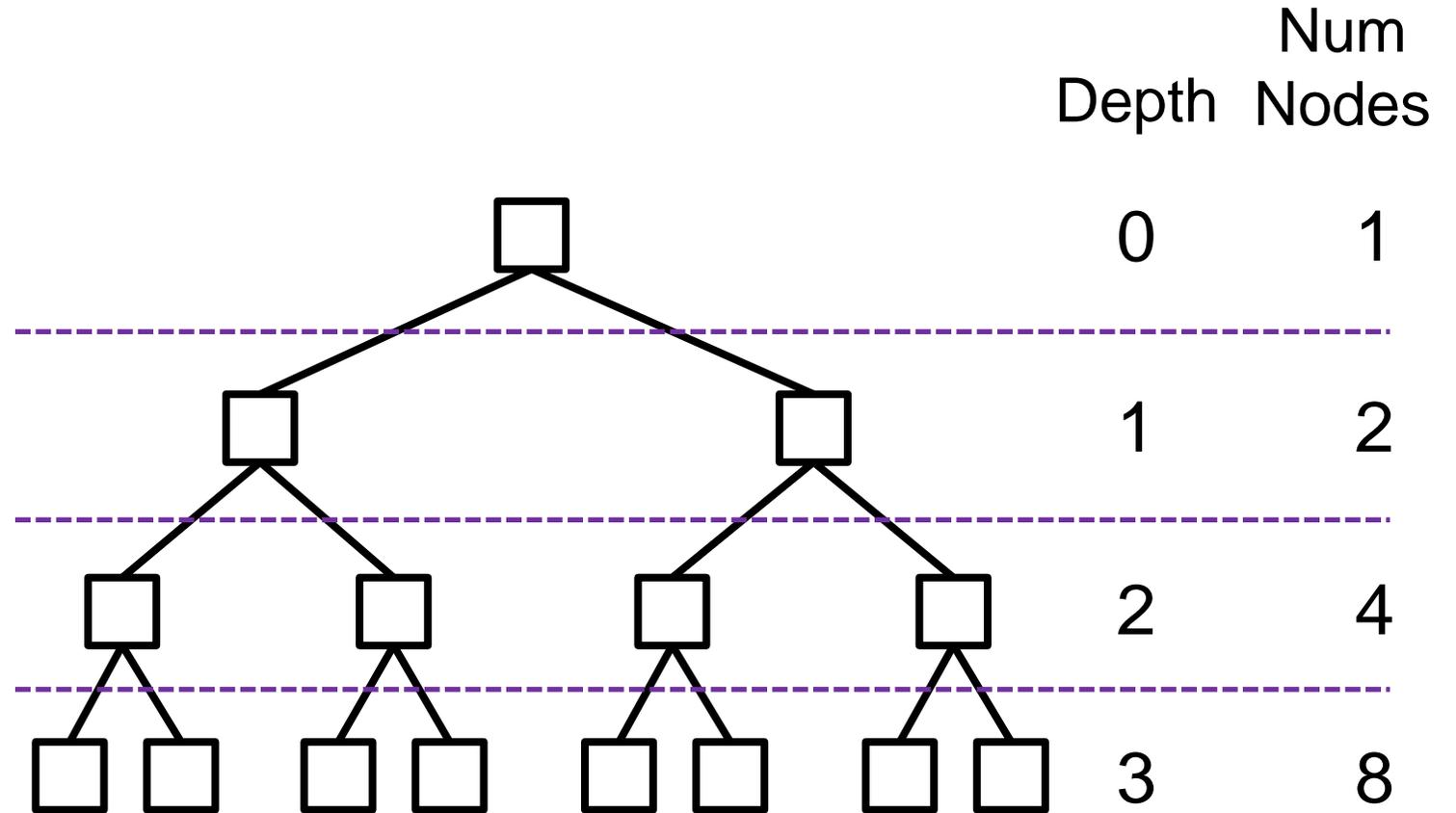
Binary Search Tree – Insertion/Searching/Removing

Running time?



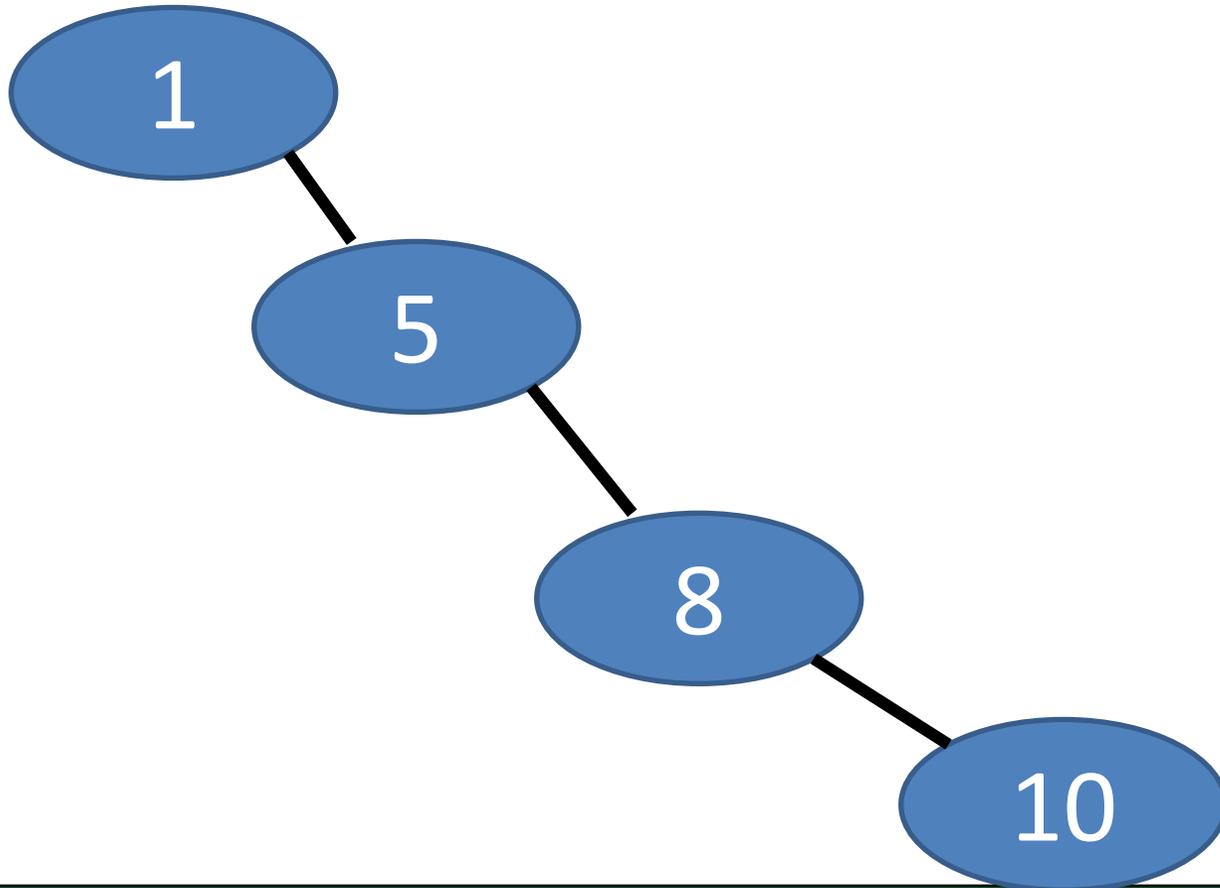
Balanced BST

A **balanced** binary tree, is defined as a binary tree in which given n nodes, the height of the tree is $O(\log n)$.



Balanced BST

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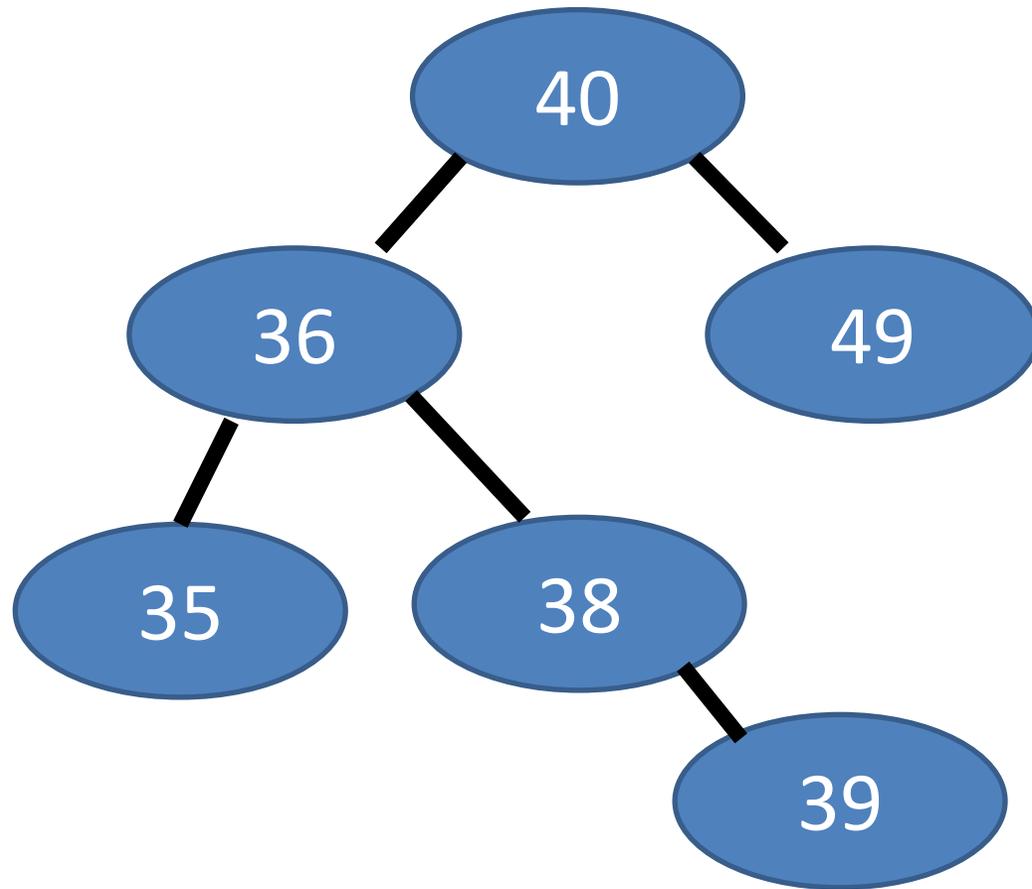
4 nodes

→ If this is a balanced tree, the height should be less than or equal to 2 ($\log(4)$)

Height = 3 → not balanced

Balanced BST

A **balanced** binary tree, is defined as a binary tree in which given n nodes, the height of the tree is **$O(\log n)$** .



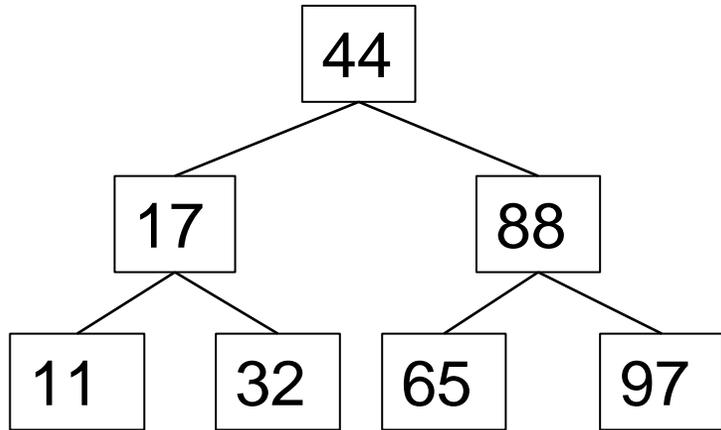
6 nodes

→ If this is a balanced tree, the height should be less than or equal to 3
 $\text{ceil}(\log(6))$

Height = 3 → balanced

Balanced BST

If we are building a BST, there is no guarantee that the tree will be balanced (it depends on the order that we add nodes)



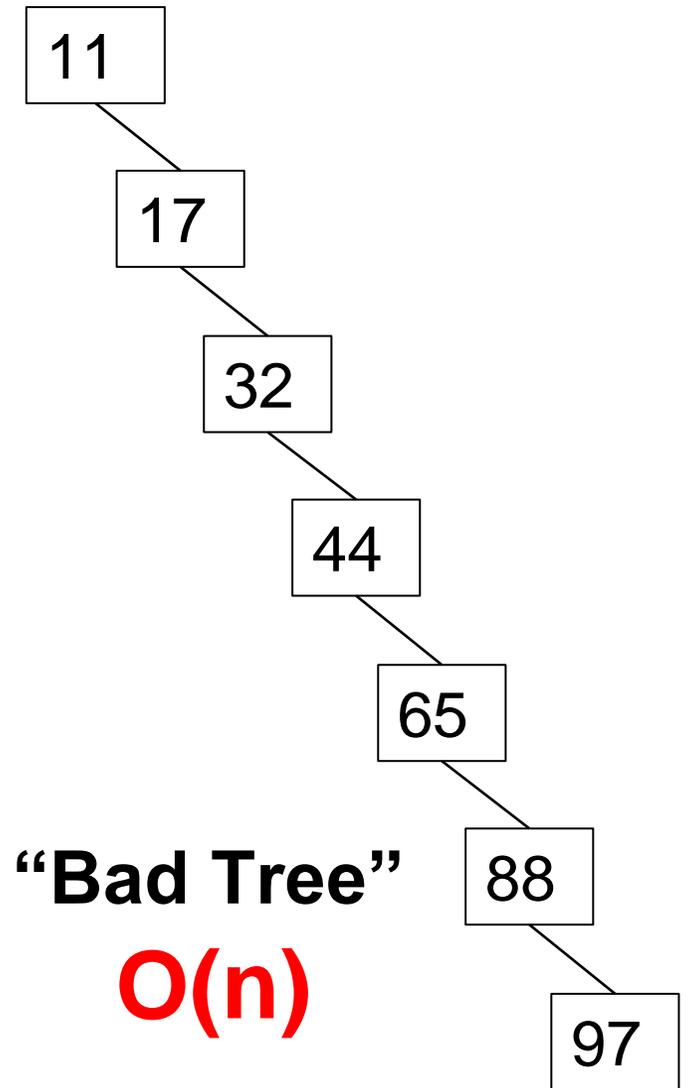
44, 17, 88, 11, 32, 65, 97

44, 17, 32, 88, 11, 97, 65

44, 88, 65, 97, 17, 32, 11

“Good Tree”

$O(\log n)$



“Bad Tree”

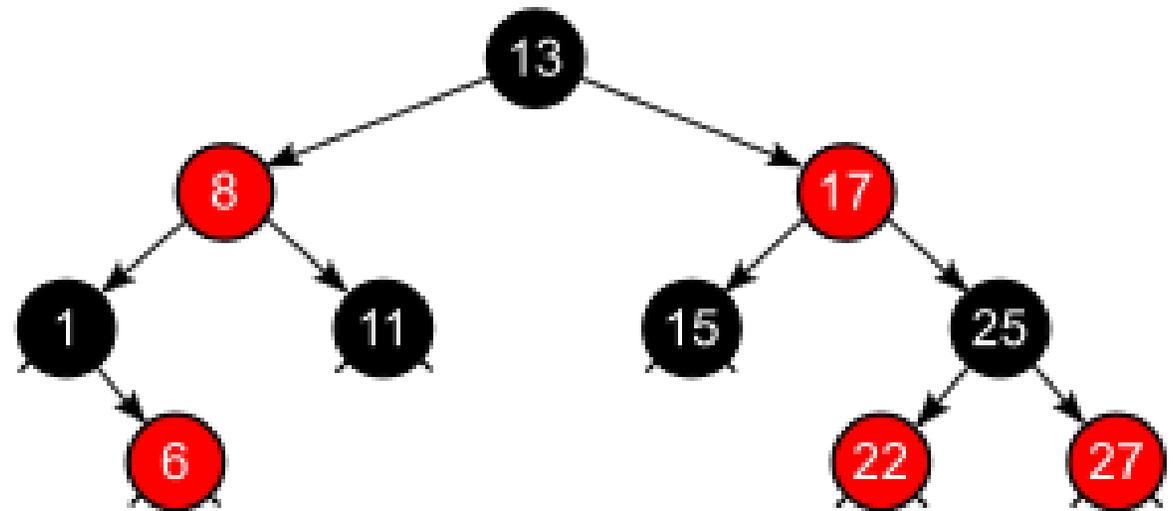
$O(n)$

Balanced BST

Red-Black Trees are a type of BST with some more rules, and if we follow the rules, we will be **guaranteed** a balanced BST

Guaranteed Balanced BST =

- **$O(\log n)$** insertion time
- **$O(\log n)$** deletion time
- **$O(\log n)$** searching time

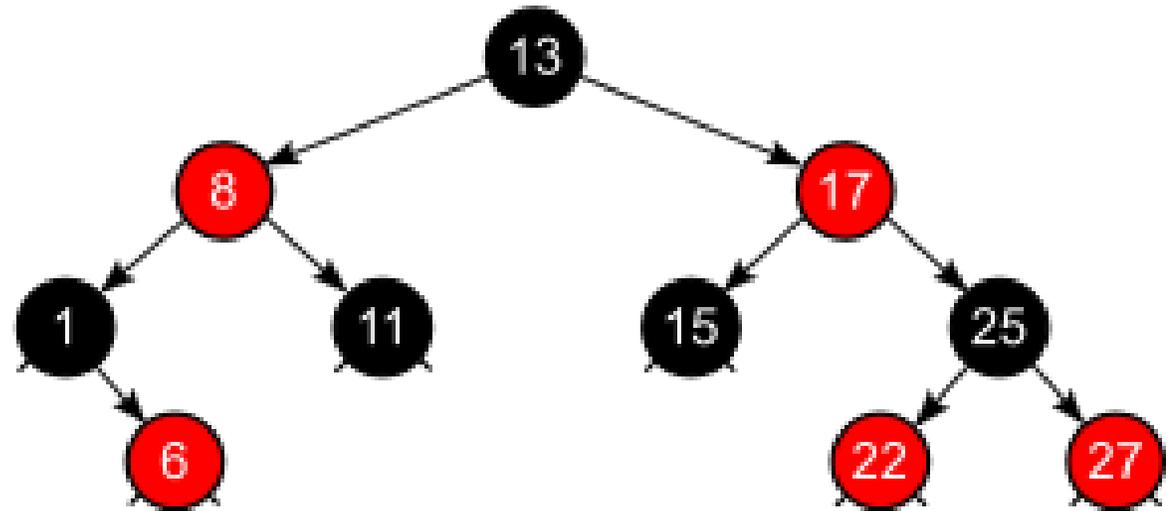


Balanced BST

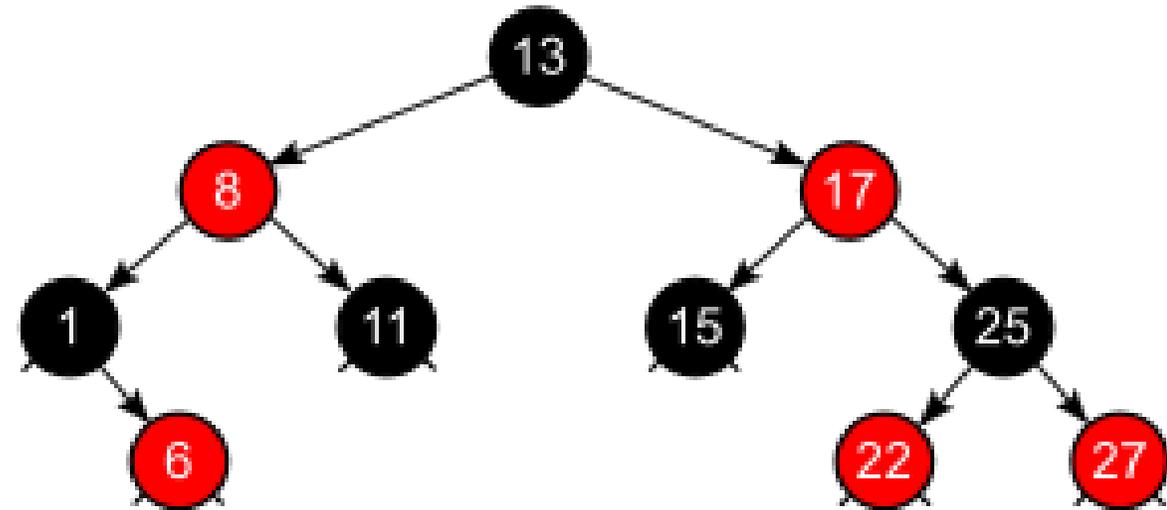
Because a RBT is a BST, we still need to make sure

- Everything to the left of the node is less than the node
- Everything to the right of the node is greater than the node
- A node cannot have more than two children
- No duplicate nodes

(BST Rules)



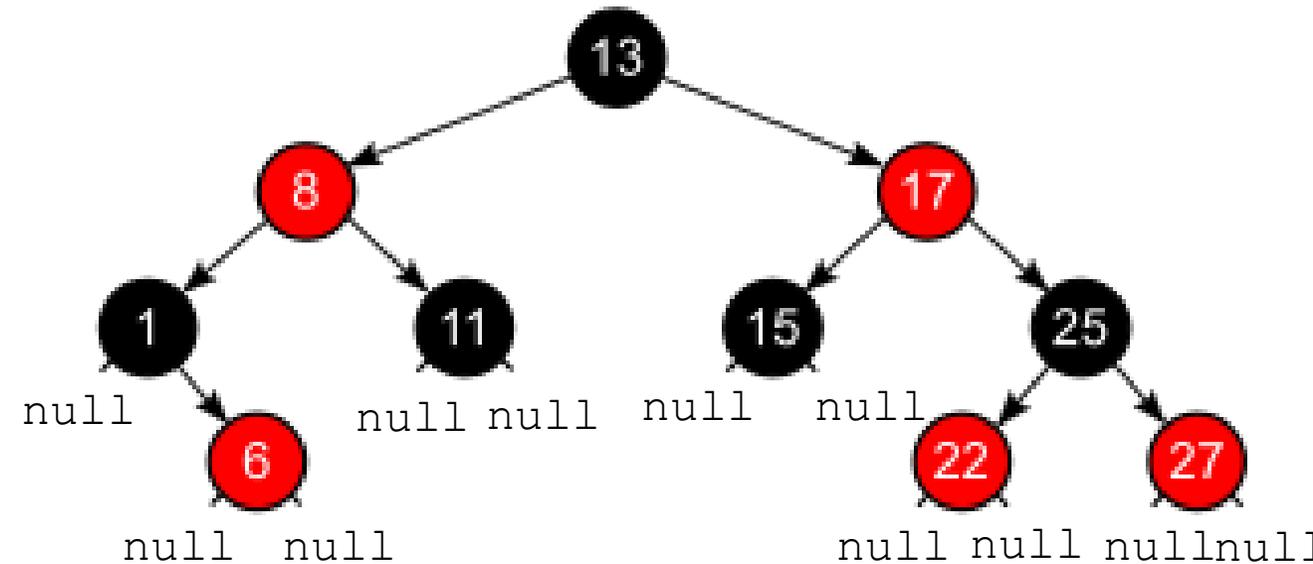
1. Every node is either **red** or **black**



Red-Black Tree Rules

Each Node now has a **color** (red or black)

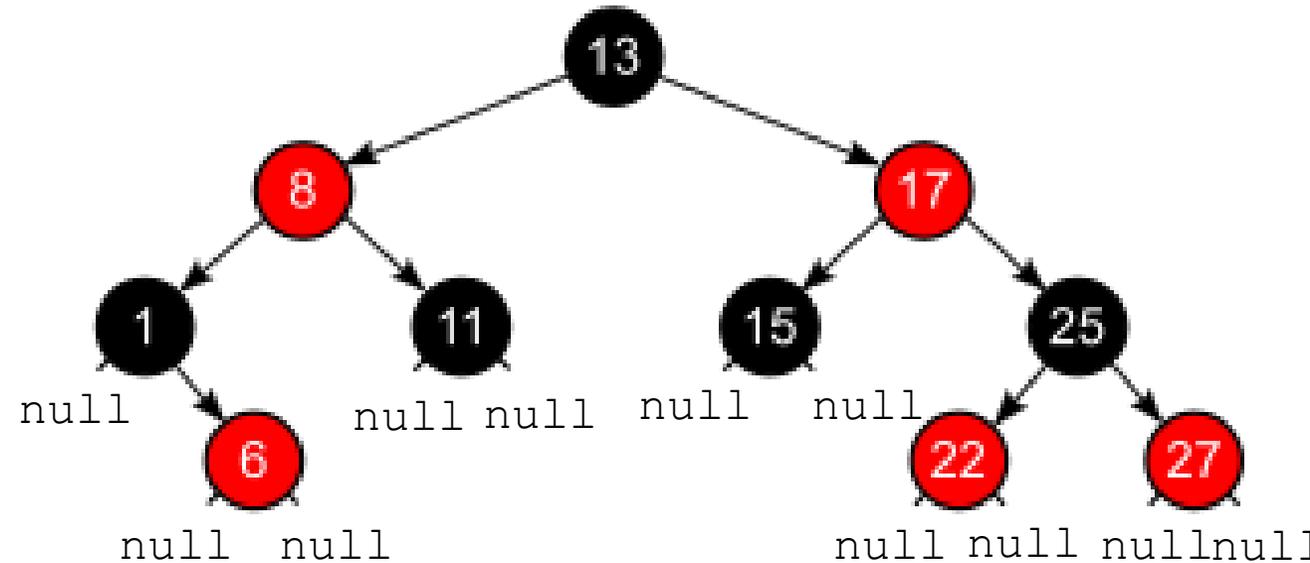
1. Every node is either **red** or **black**
2. The `null` children are **black**



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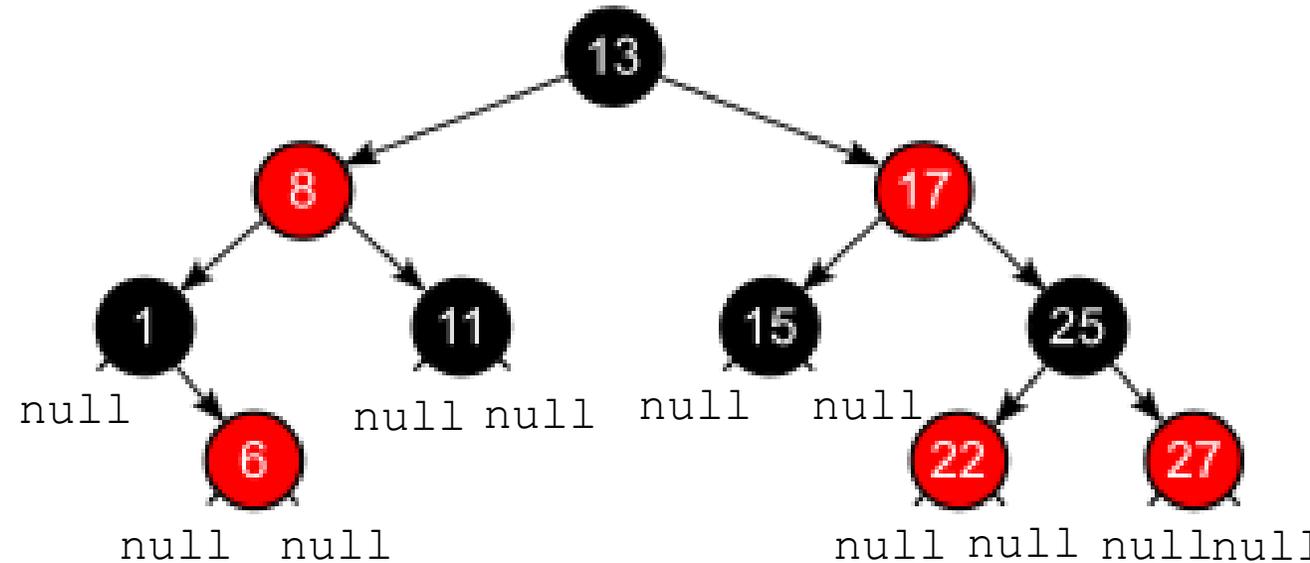
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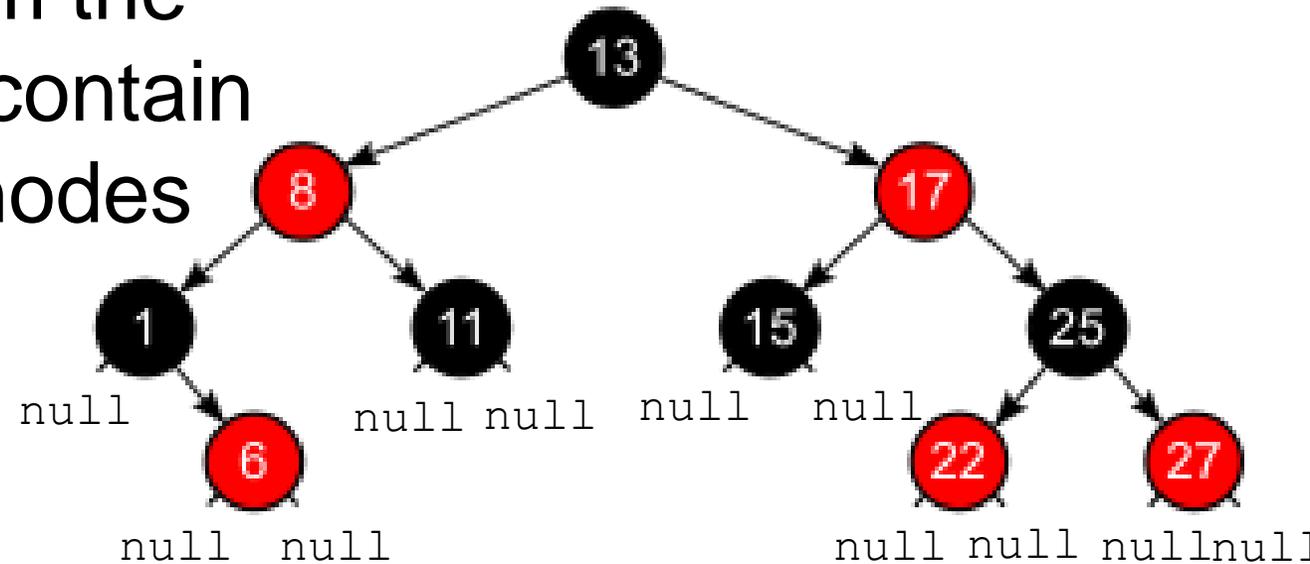
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Red-Black Tree Rules

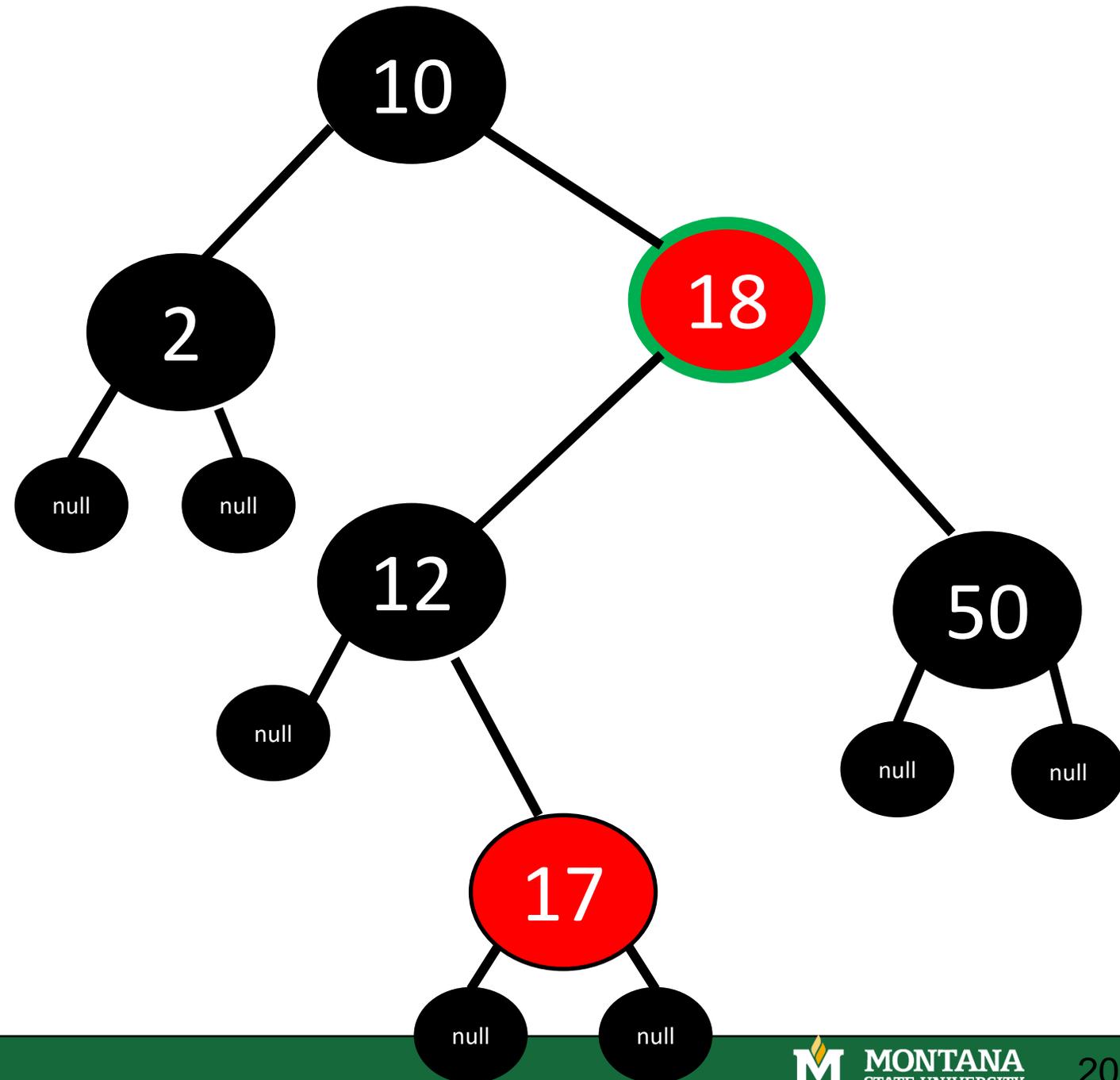
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2. The `null` children are **black**
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5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes



Red-Black Tree Rules

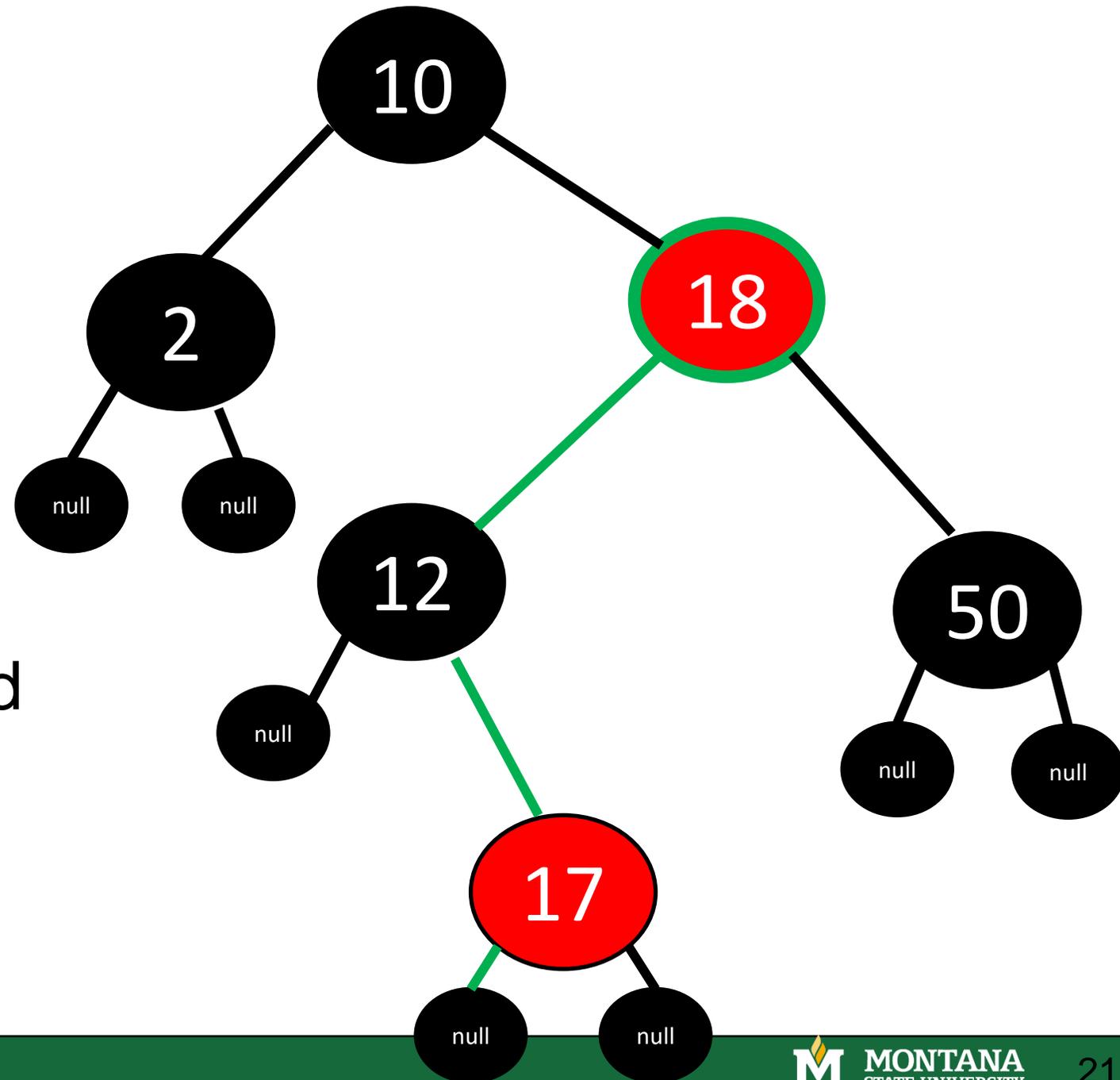
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Red-Black Tree Rules

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

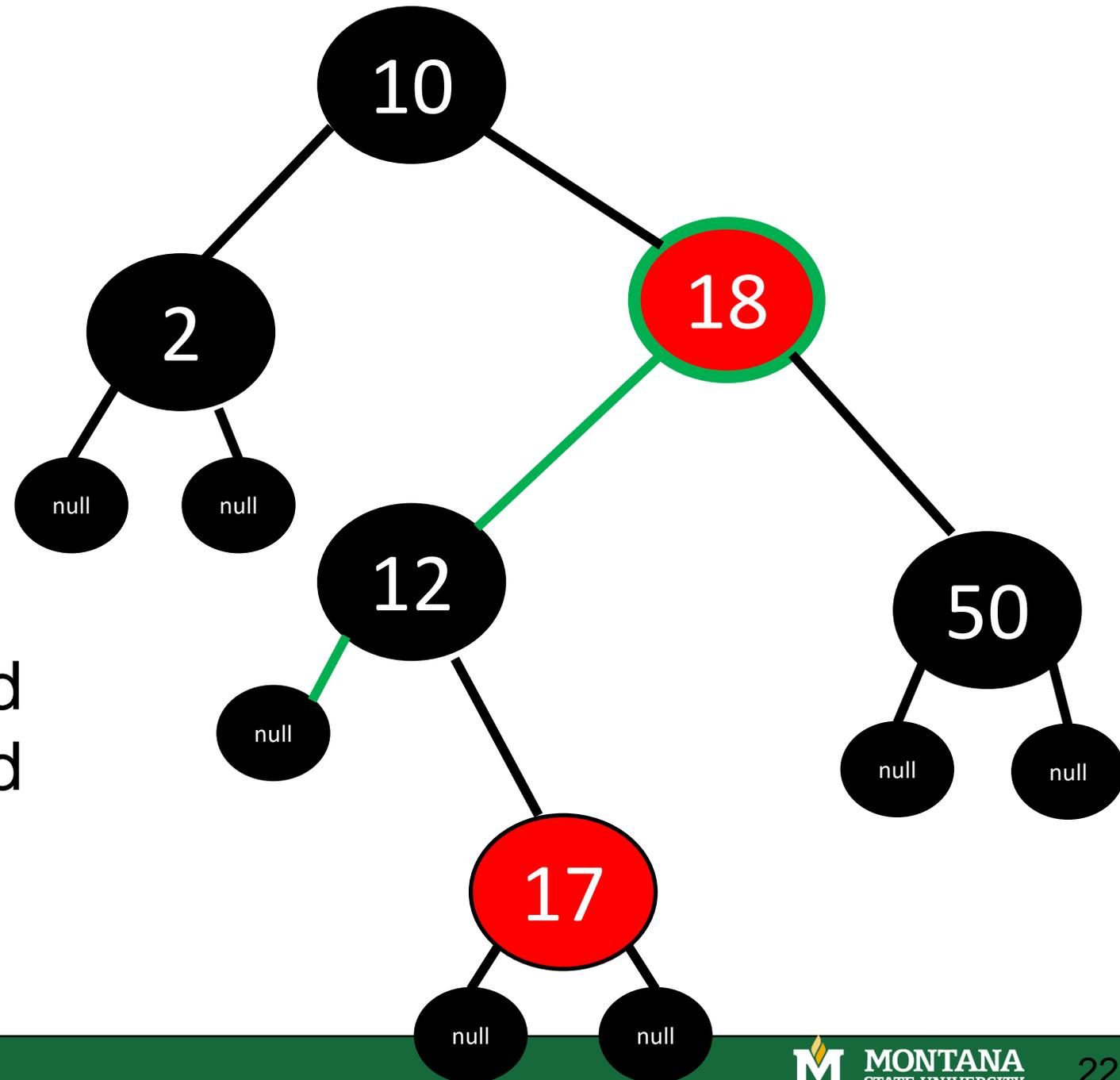
Path 1: 2 black nodes visited



Red-Black Tree Rules

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

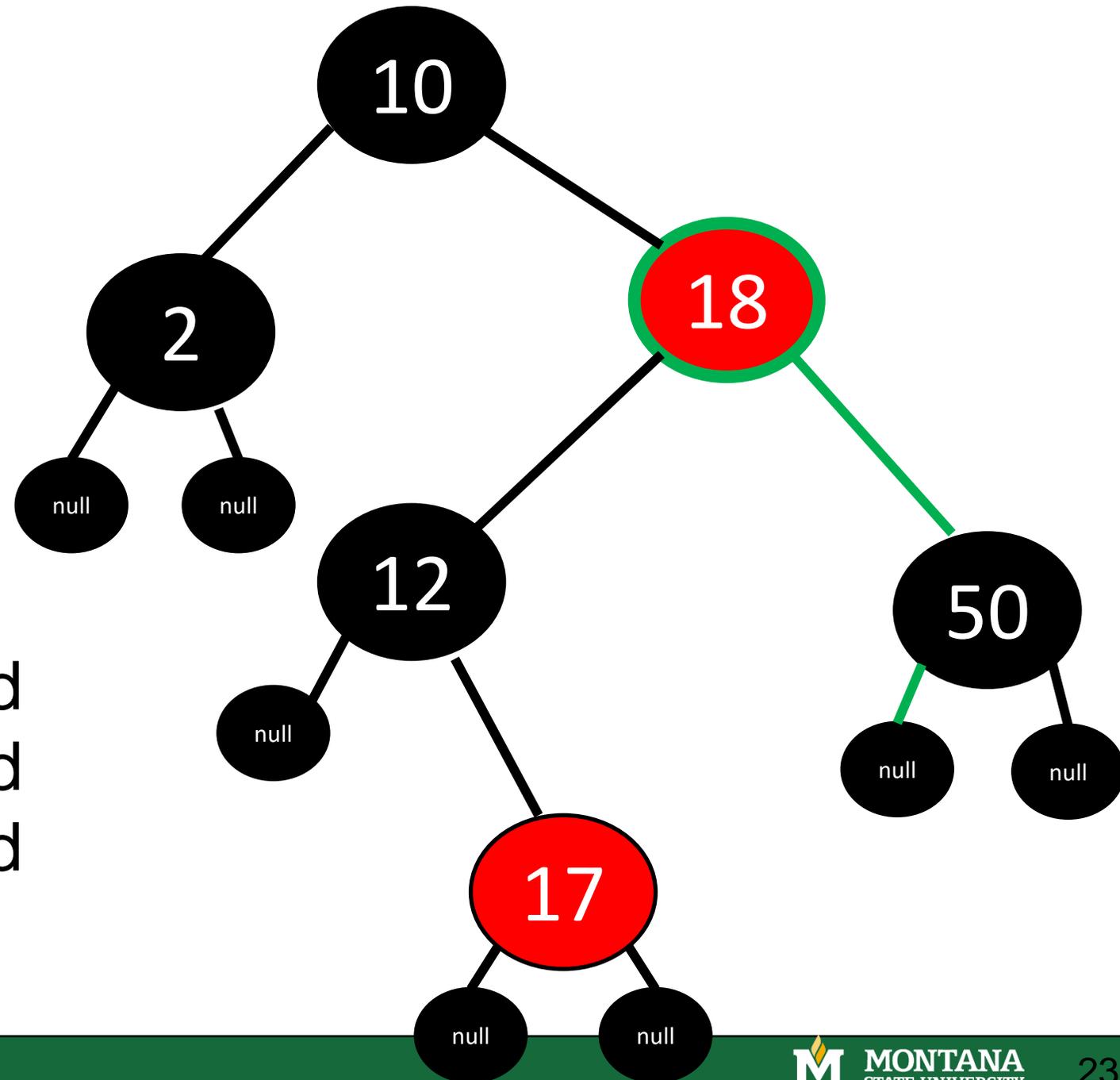
Path 1: 2 black nodes visited
Path 2: 2 black nodes visited



Red-Black Tree Rules

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

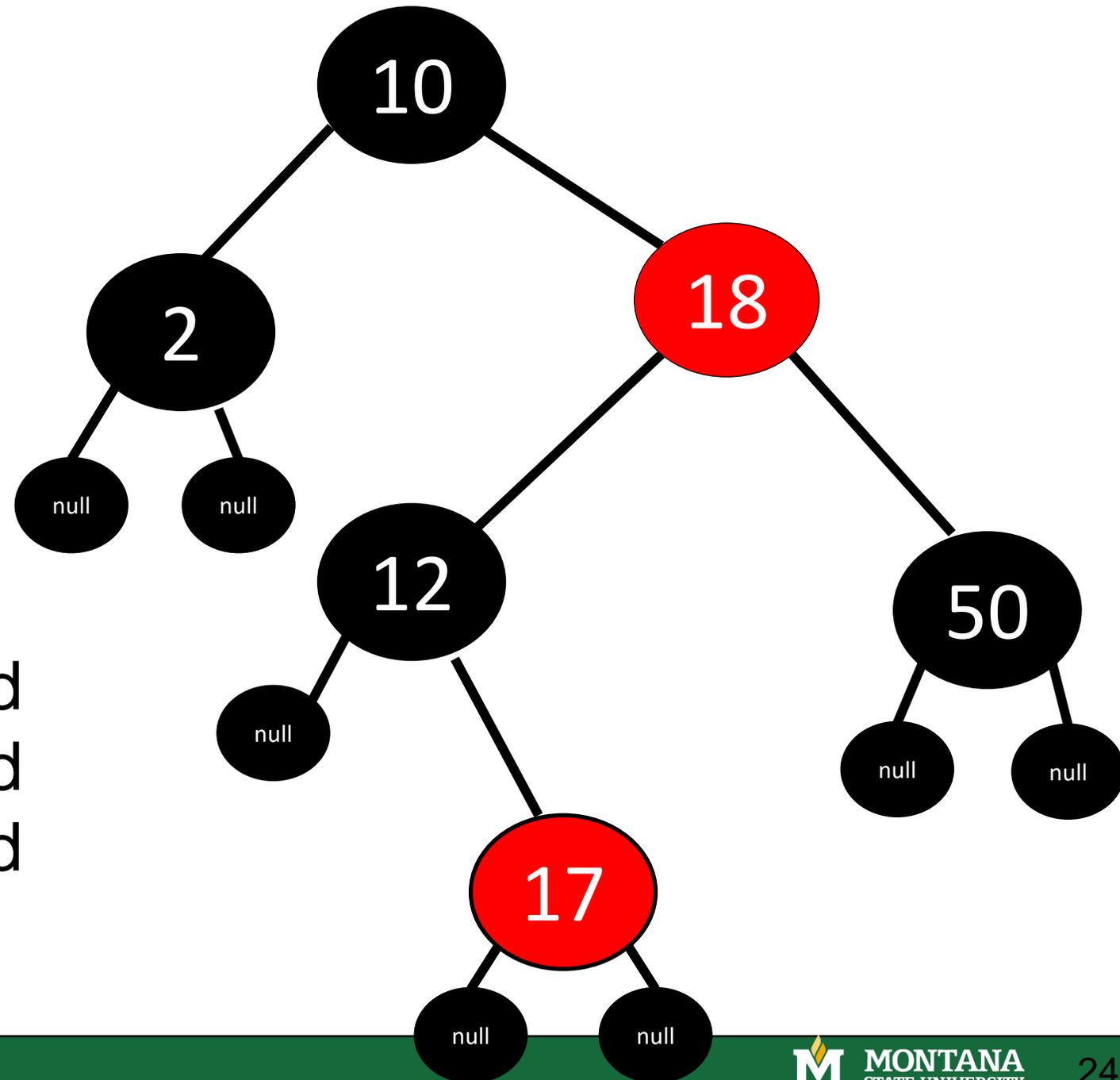
Path 1: 2 black nodes visited
Path 2: 2 black nodes visited
Path 3: 2 black nodes visited



Red-Black Tree Rules

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

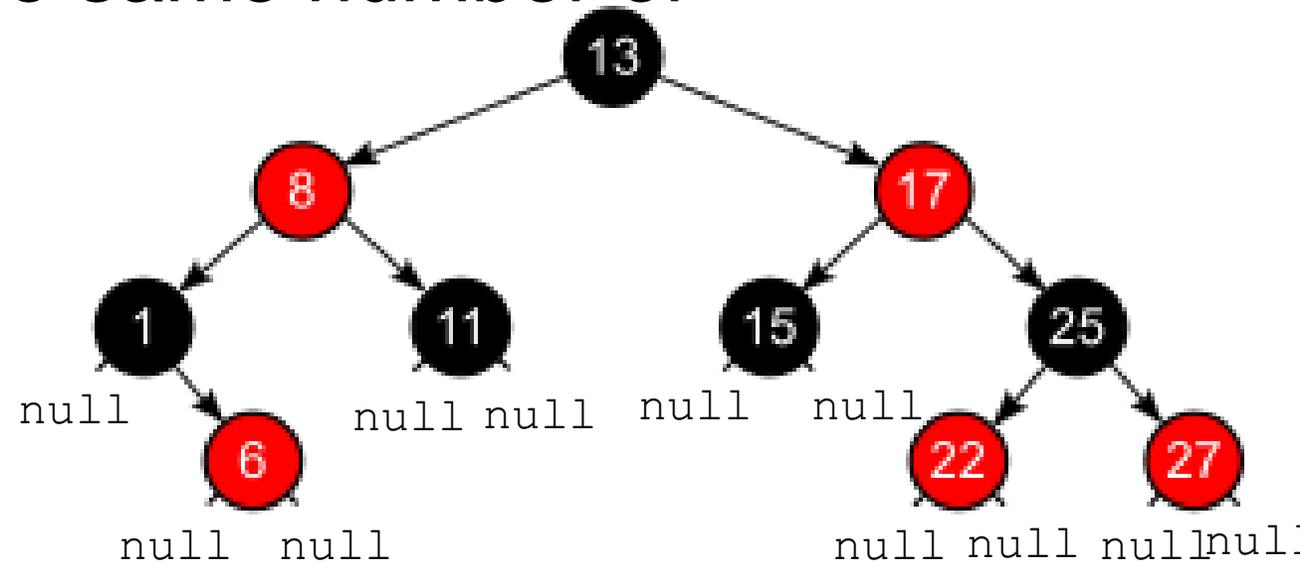
Path 1: **2** black nodes visited
Path 2: **2** black nodes visited
Path 3: **2** black nodes visited



Red-Black Tree Rules

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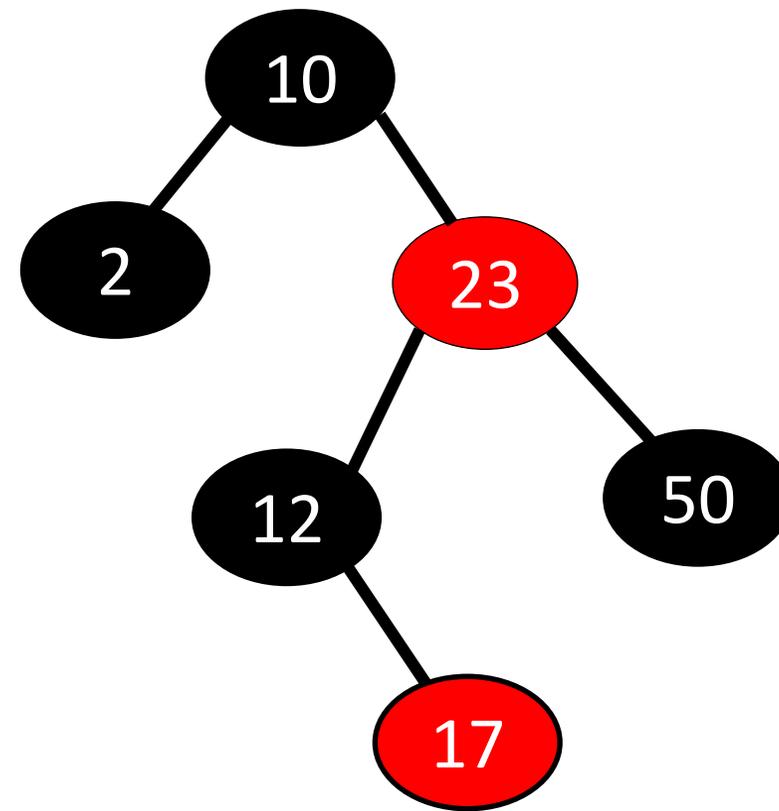
When we **insert** or **delete** something from a Red-Black tree, the new tree may **violate** one of these rules



Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

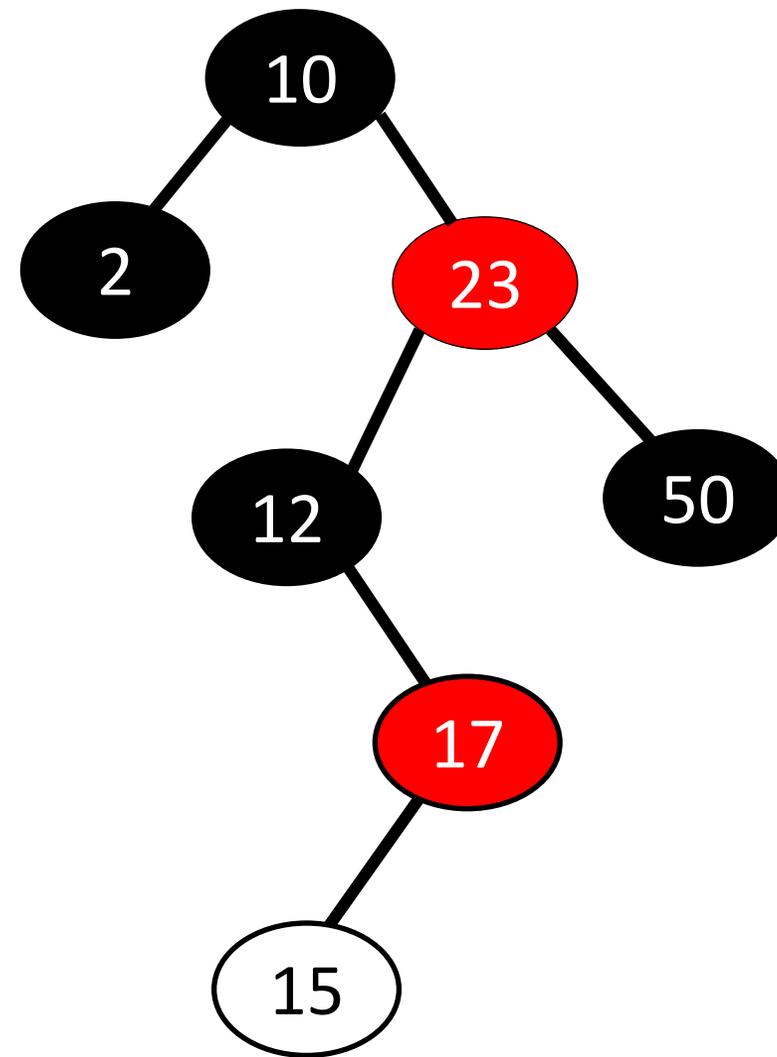


Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

Our tree no longer has $\log(n)$ height, so we need to do some operations to reduce the height of the tree

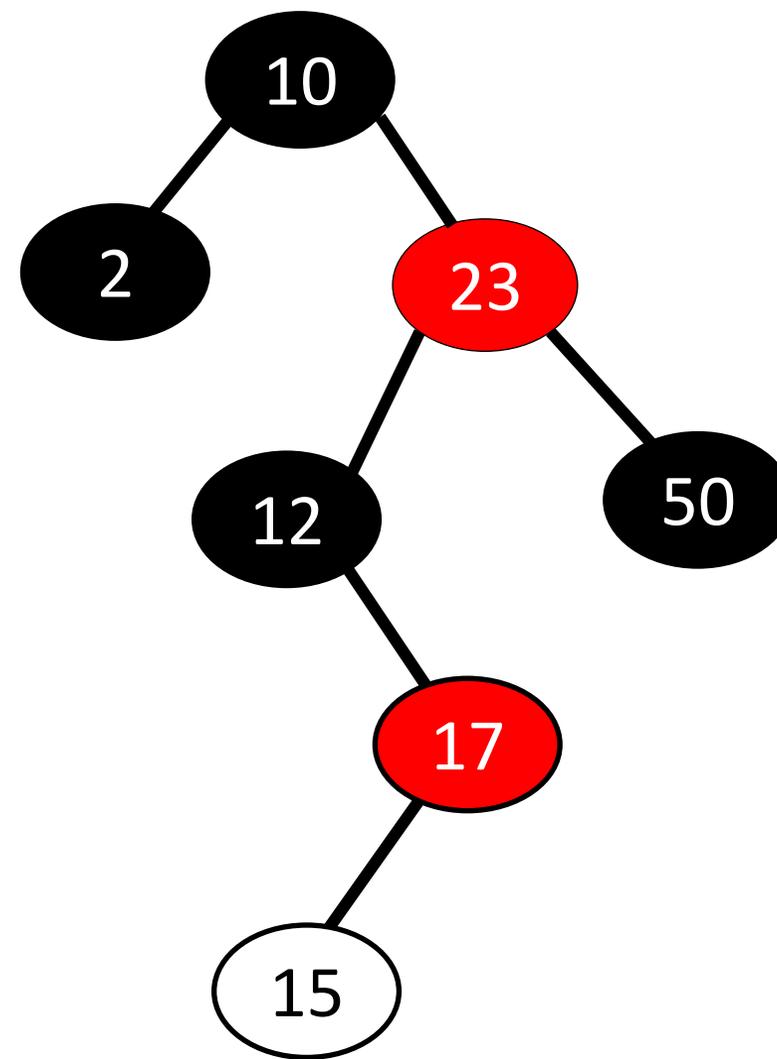


Red-Black Tree Insertion/Deletion

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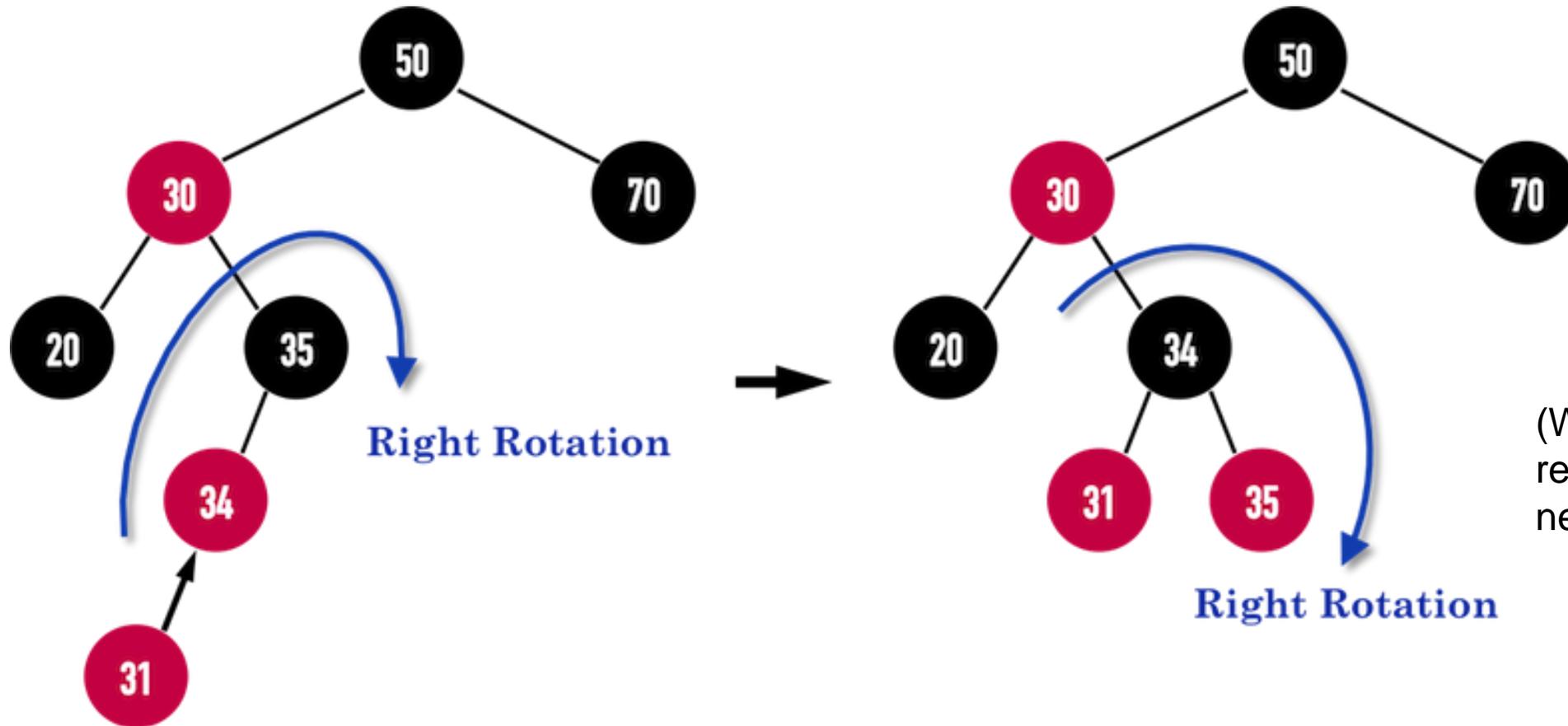
Step 1: Do the normal BST insertion

Our tree no longer has $\log(n)$ height, so we need to do some operations to reduce the height of the tree



These operations are known as **rotations**

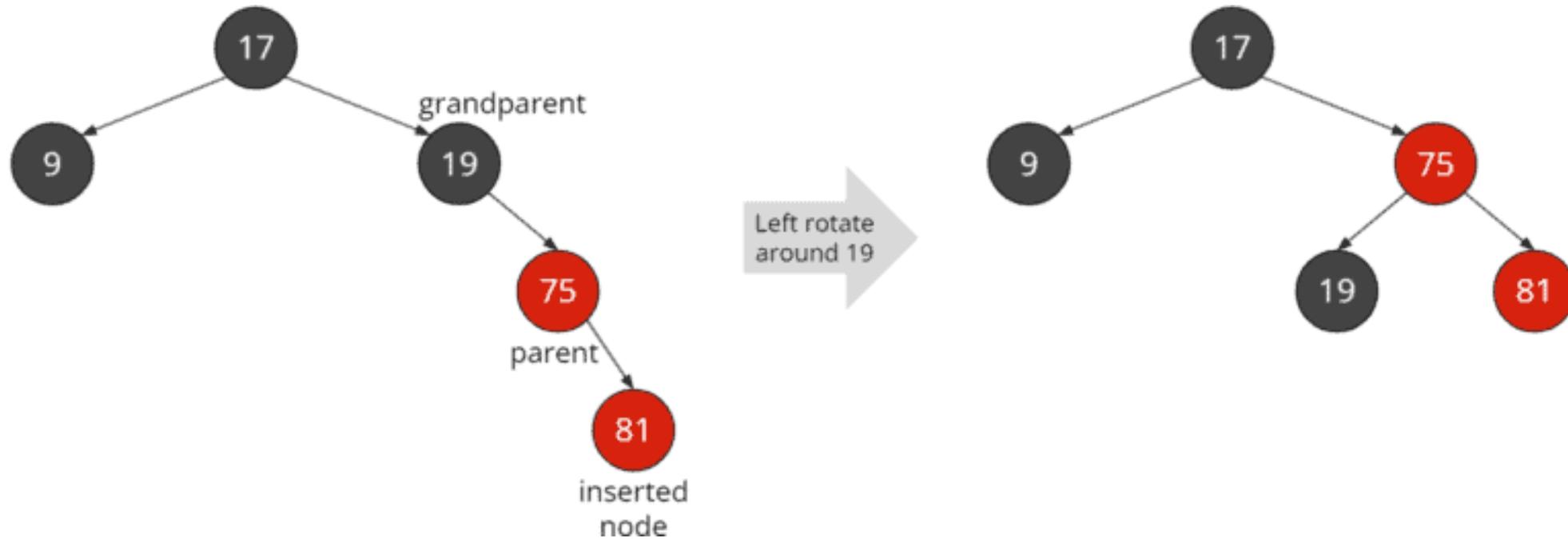
Red-Black Tree Rotation



(We also do some recoloring if needed!)

Local transformation (we rotate just a section– not the entire tree)

Red-Black Tree Rotation



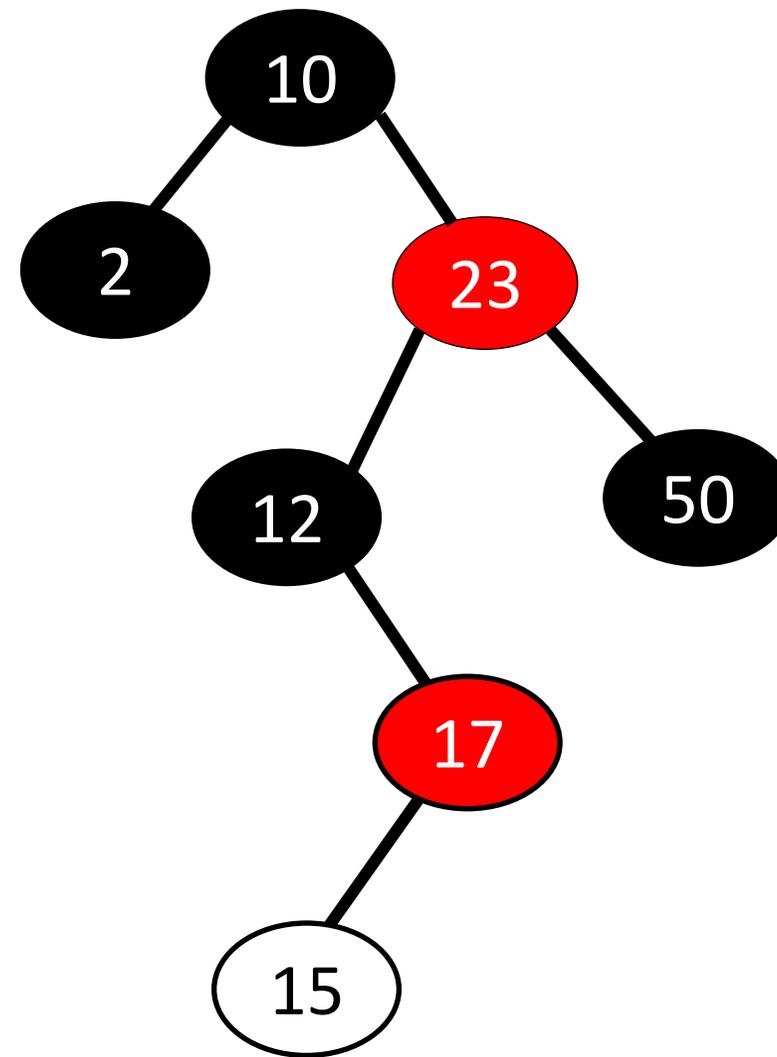
Local transformation (we rotate just a section– not the entire tree)

Red-Black Tree Insertion/Deletion

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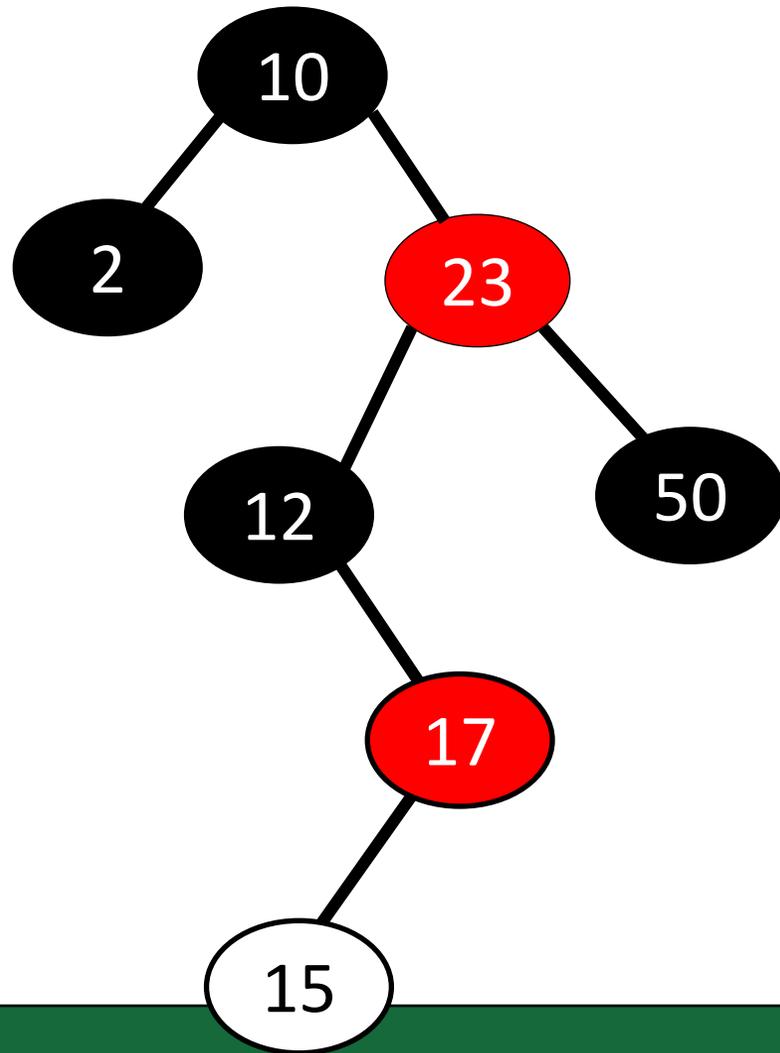
These operations are known as **rotations**

Red-Black Tree Insertion/Deletion

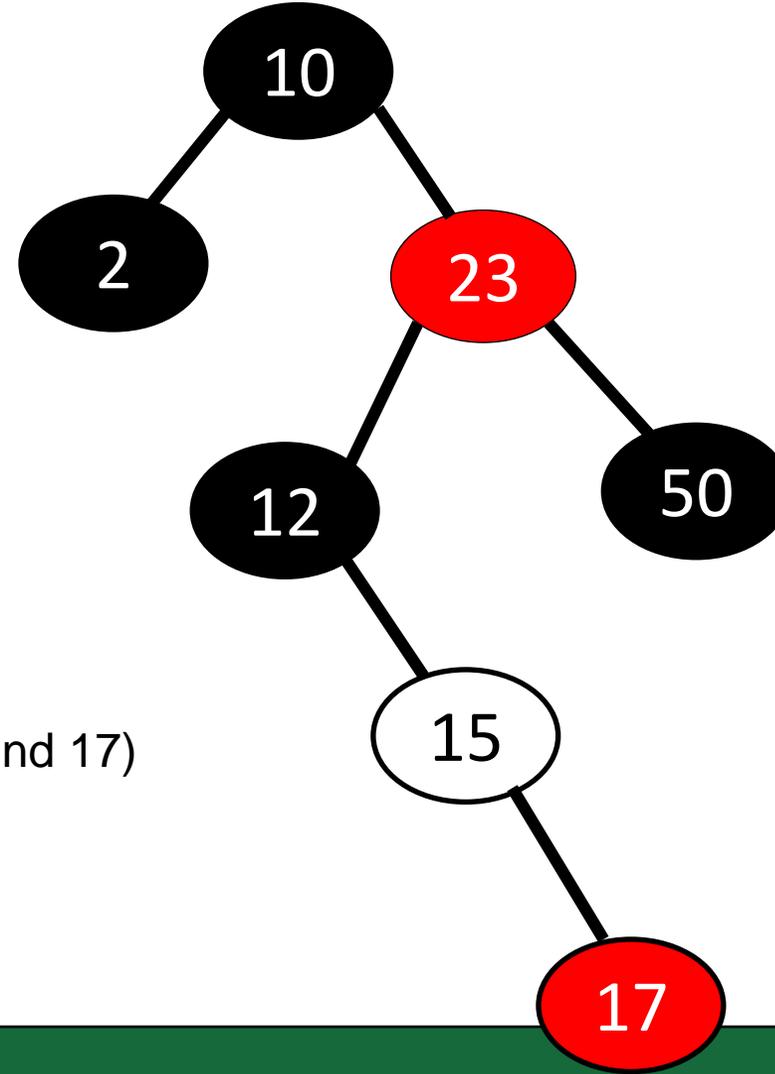
`insert(15)`

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

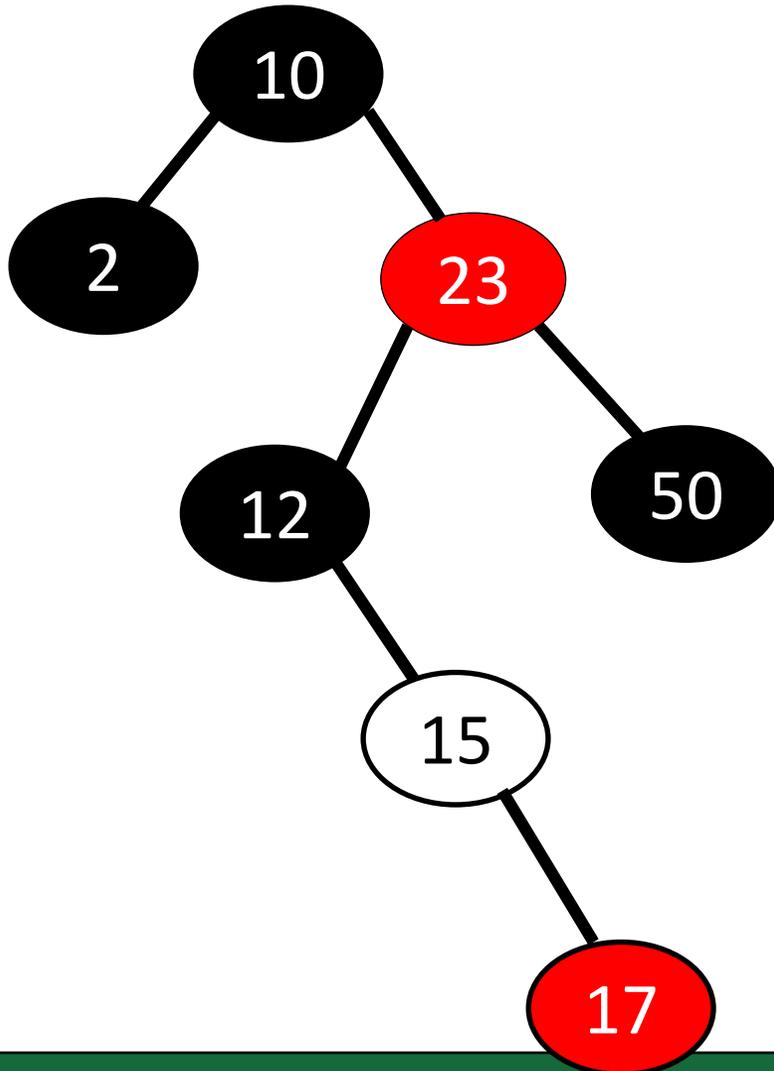


(Rotate Right around 17)



Red-Black Tree Insertion/Deletion

`insert(15)`

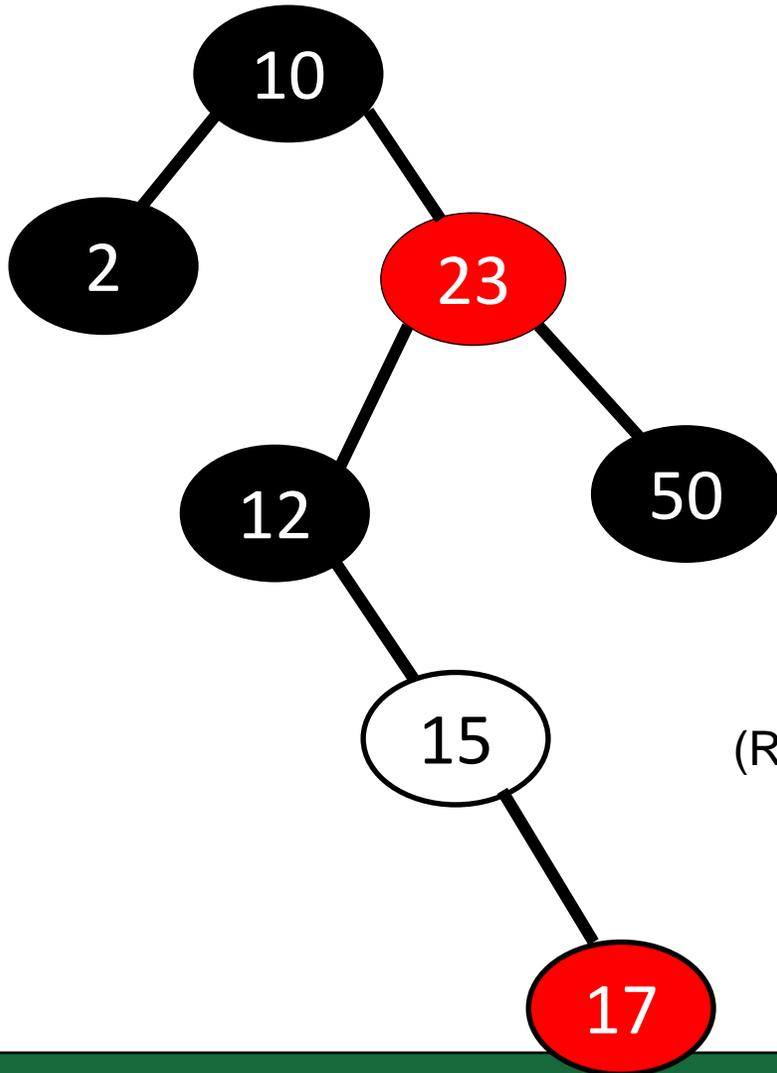


Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Red-Black Tree Insertion/Deletion

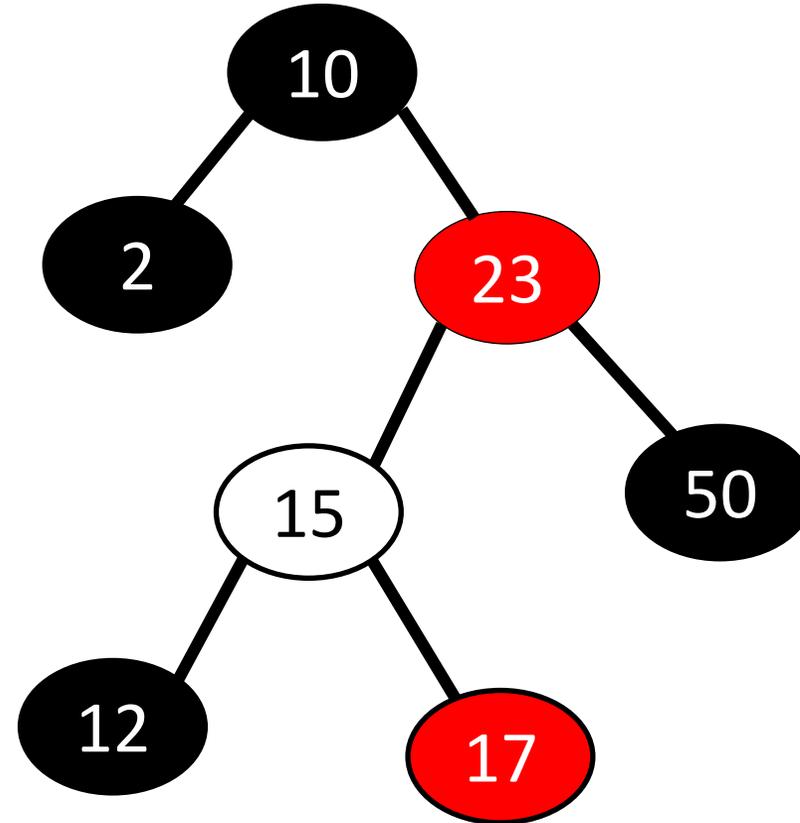
`insert(15)`



(Rotate left around 12)

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)



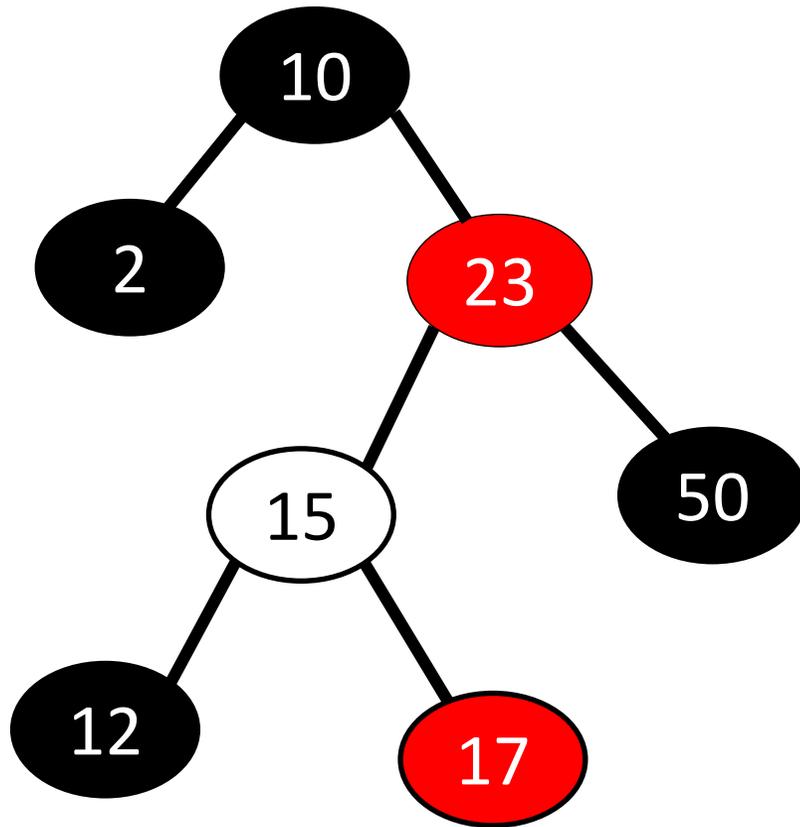
Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor



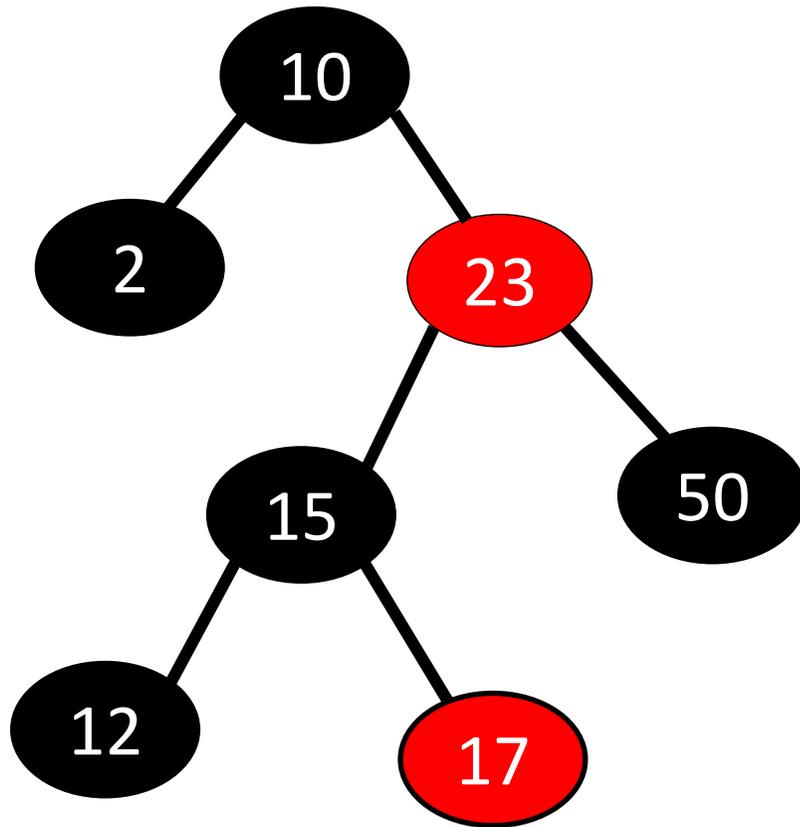
Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

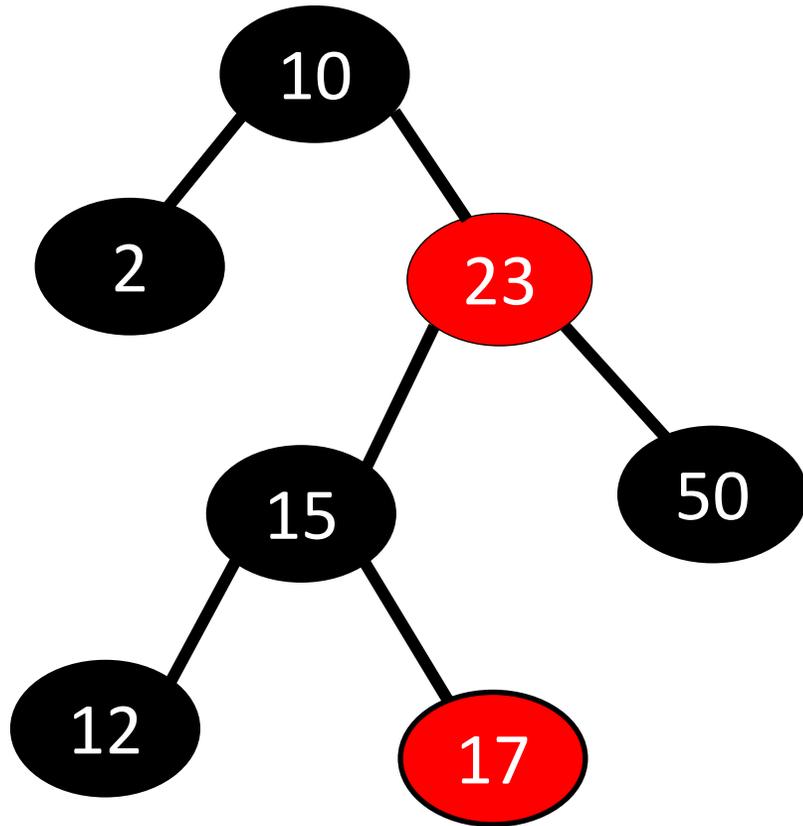
Step 3: Recolor



15 has to be black because....

Red-Black Tree Insertion/Deletion

```
insert(15)
```



Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

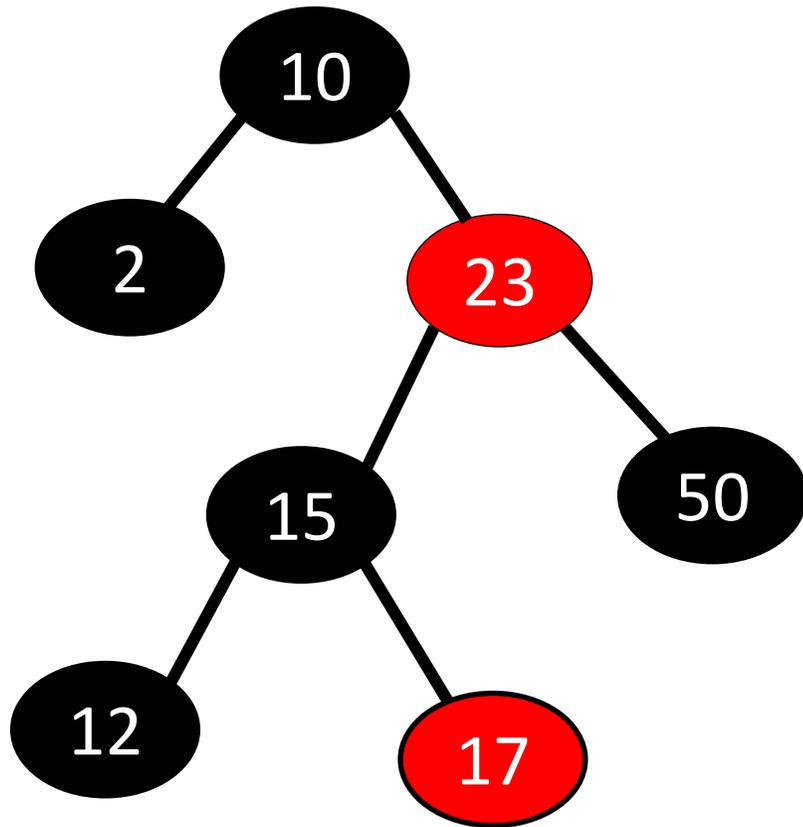
Step 3: Recolor

3. If a node is **red**, both children must be **black**

15 has to be black because 23 is red

Red-Black Tree Insertion/Deletion

`insert(15)`



Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor

Is this a Red-Black tree?

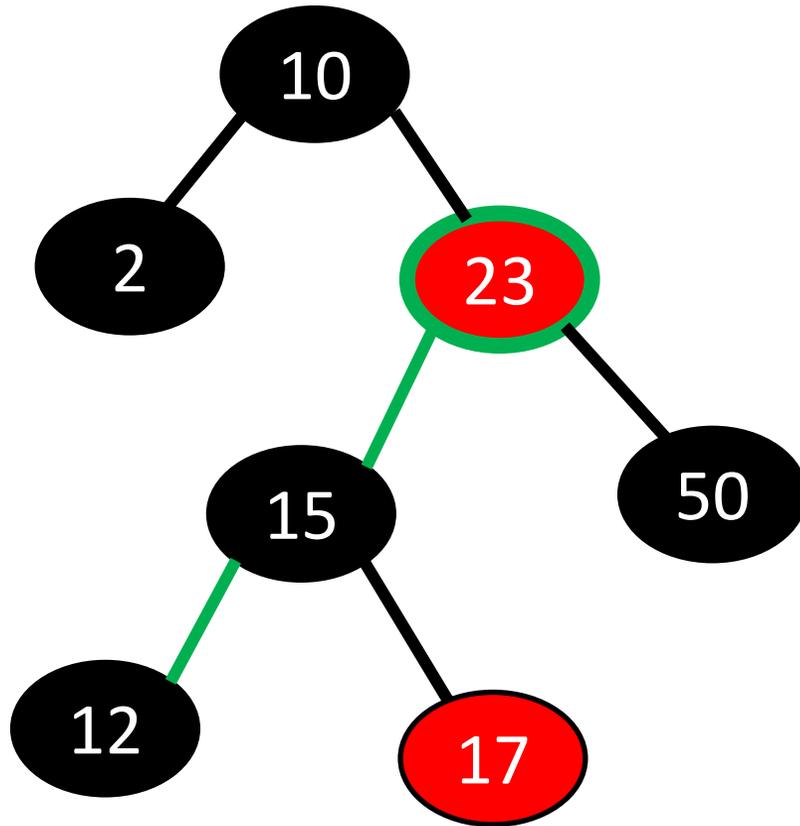
Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor



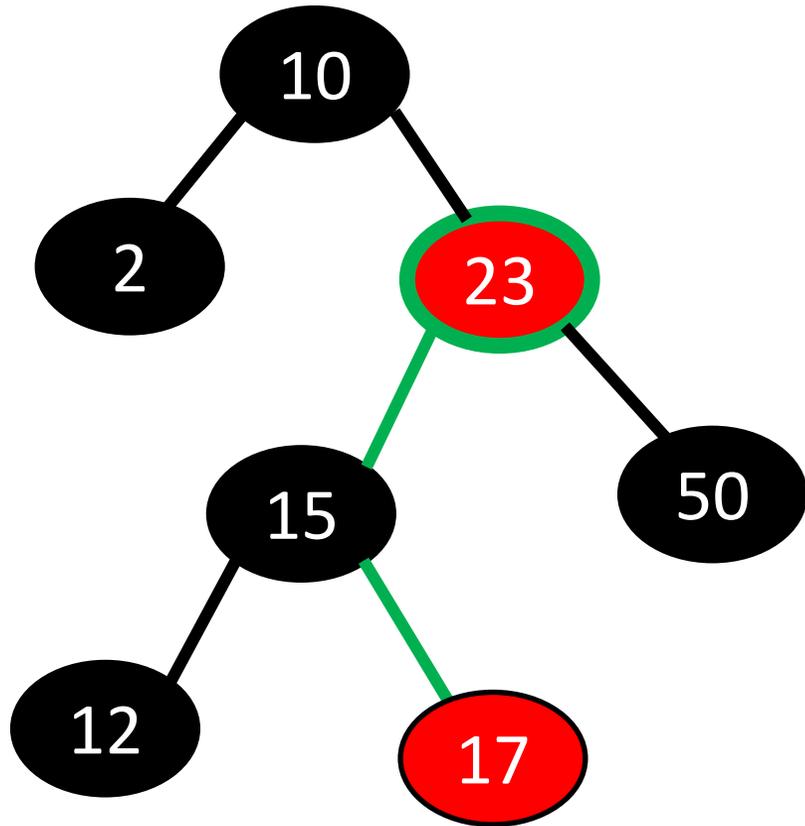
Is this a Red-Black tree?

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

Path 1: 3 black nodes (including null nodes)

Red-Black Tree Insertion/Deletion

`insert(15)`



Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor

Is this a Red-Black tree?

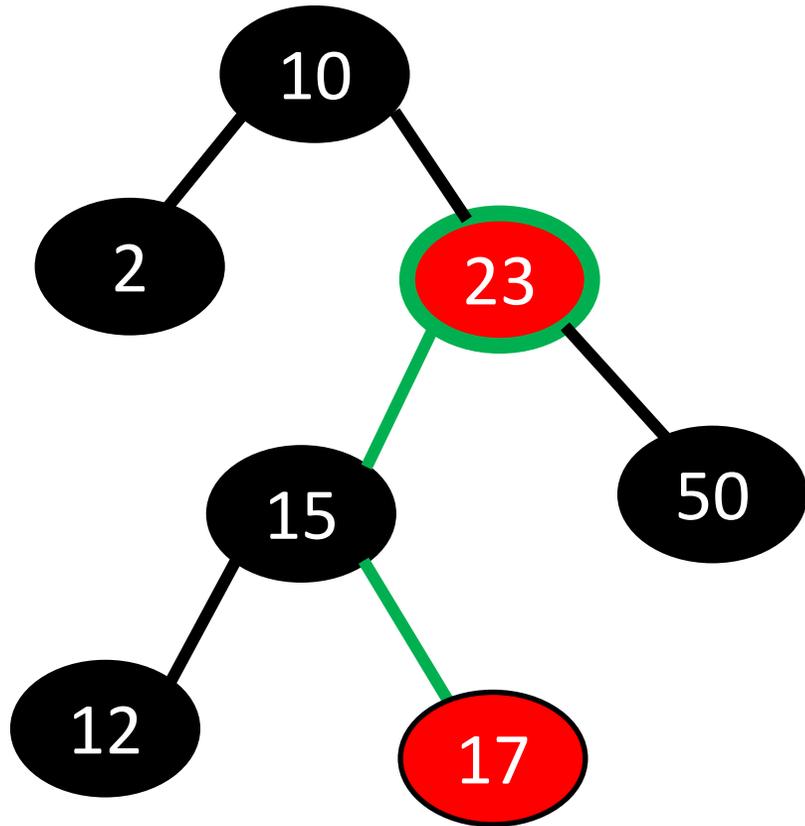
5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

Path 1: 3 black nodes (including null nodes)

Path 2: 2 black nodes (including null nodes)

Red-Black Tree Insertion/Deletion

`insert(15)`



Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor

Is this a Red-Black tree?

5. For each node, all paths from the node to descendant leaves contain the same number of **black** nodes

Path 1: 3 black nodes (including null nodes)

Path 2: 2 black nodes (including null nodes)

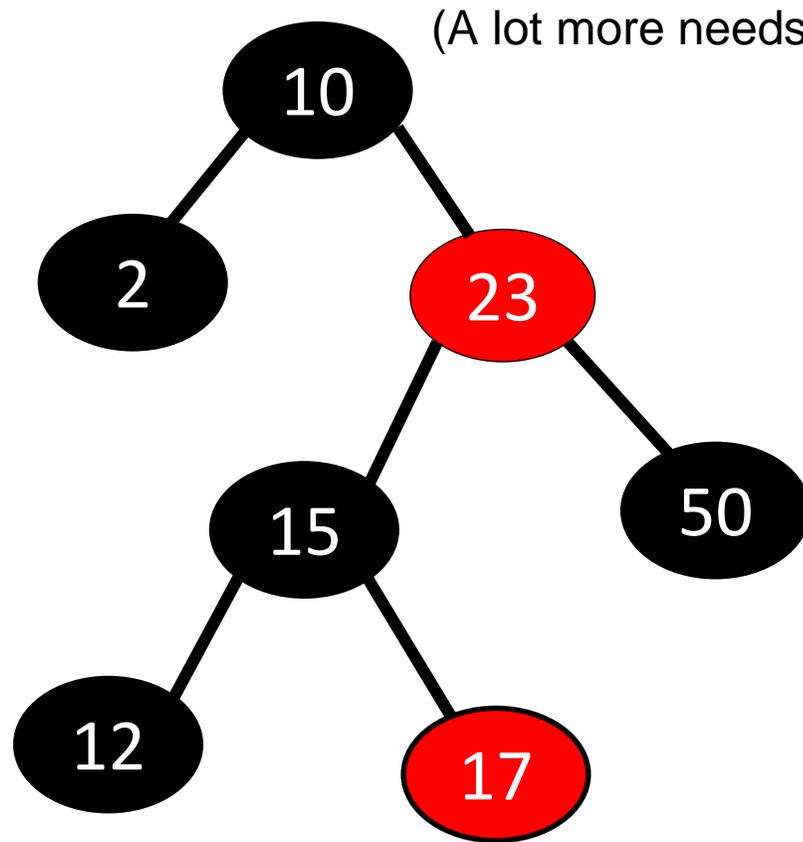
Red-Black Tree Insertion/Deletion

```
insert(15)
```

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor



1. Every node is either **red** or **black**
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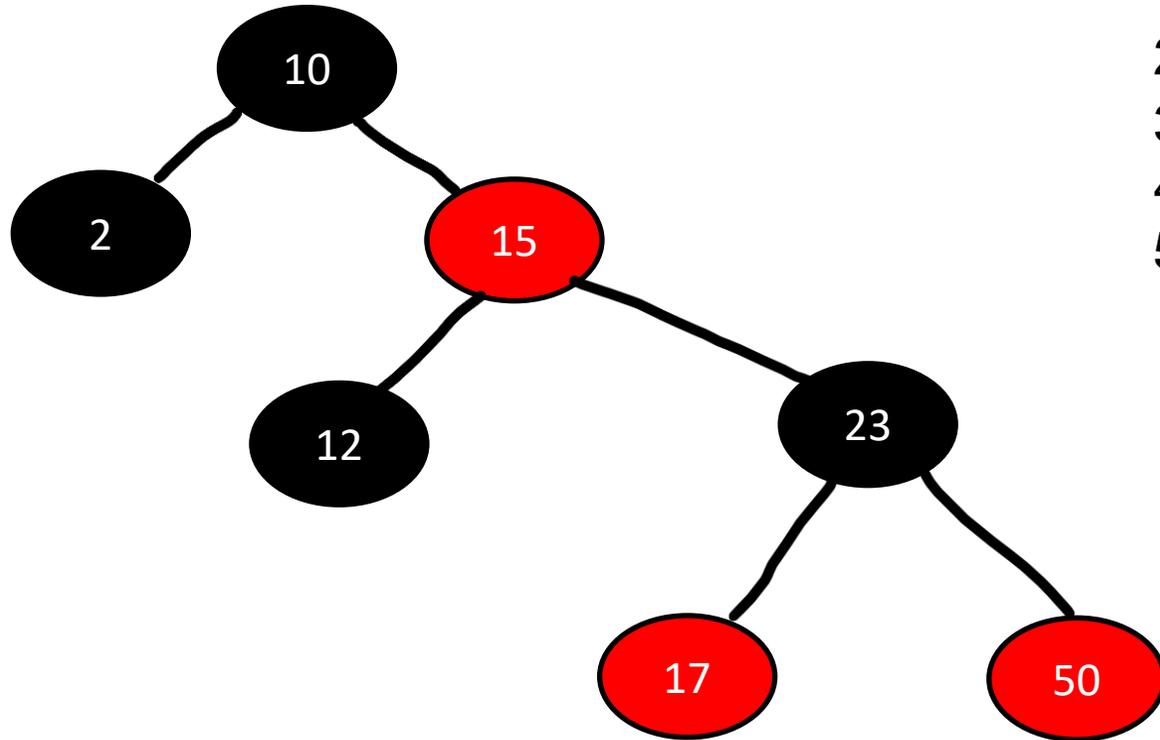
Red-Black Tree Insertion/Deletion

`insert(15)`

Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor



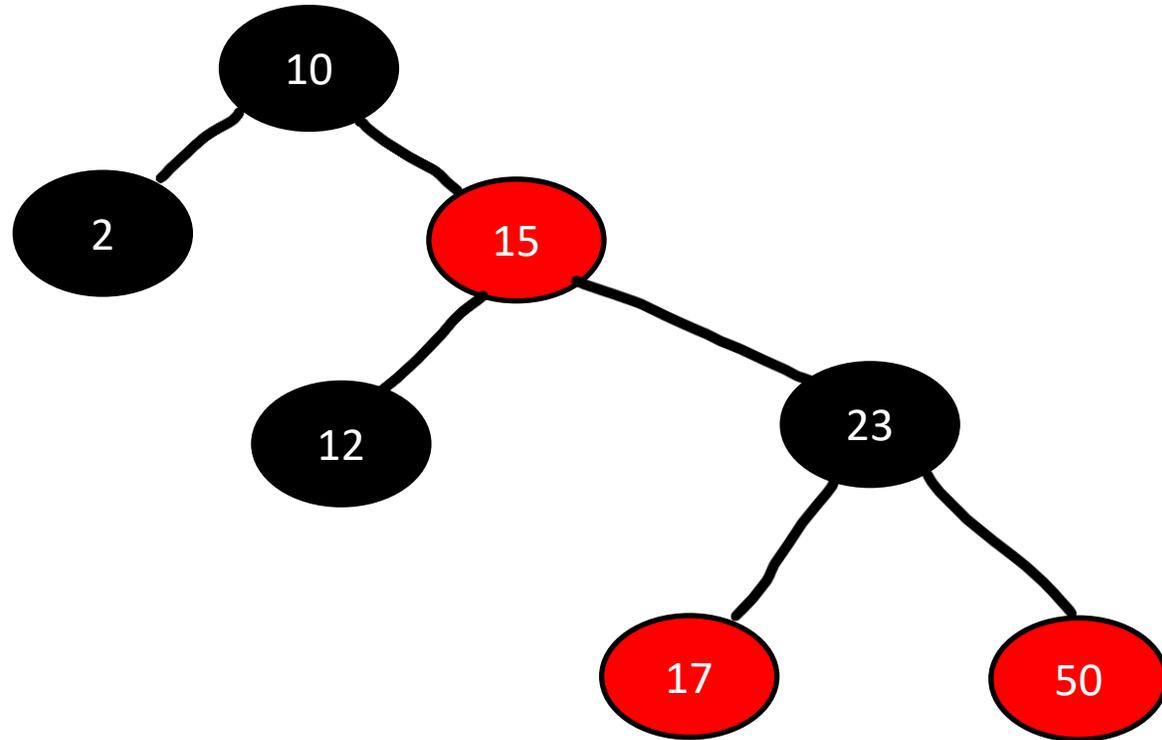
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<https://www.cs.usfca.edu/~galles/visualization/RedBlack.html>

Red-Black Tree Insertion/Deletion

`insert(15)`



Step 1: Do the normal BST insertion

Step 2: Do rotation(s)

Step 3: Recolor

Fact:

There will at most 3 rotations needed, and each rotation happens in $O(1)$ time

So, maintaining a Red/Black tree happens in $O(1)$ time

Red-Black Tree Insertion/Deletion

`delete(15)`

(Deleting is not as scary, because deleting a node will never increase the height of the tree)

Step 1: Do the normal BST deletion

- Case 1: no children
- Case 2: 1 child
- Case 3: 2 children

Step 2: Do rotation(s) (optional?)

Step 3: Recolor

Fact:

There will at most 3 rotations needed, and each rotation happens in $O(1)$ time

So, maintaining a Red/Black tree happens in $O(1)$ time

Takeaways

We can add a color (**red** or black) instance field to our nodes to create a Red Black Tree

If we follow the rules of a Red Black Tree, and follow the proper rotations/recoloring steps, we can guarantee that our tree will be balanced

Guaranteed Balanced BST =

- $O(\log n)$ insertion
- $O(\log n)$ deletion
- $O(\log n)$ Searching/Contains

There are also BSTs called **AVL tree** and **2-3 trees** that serve the same purpose of RB trees

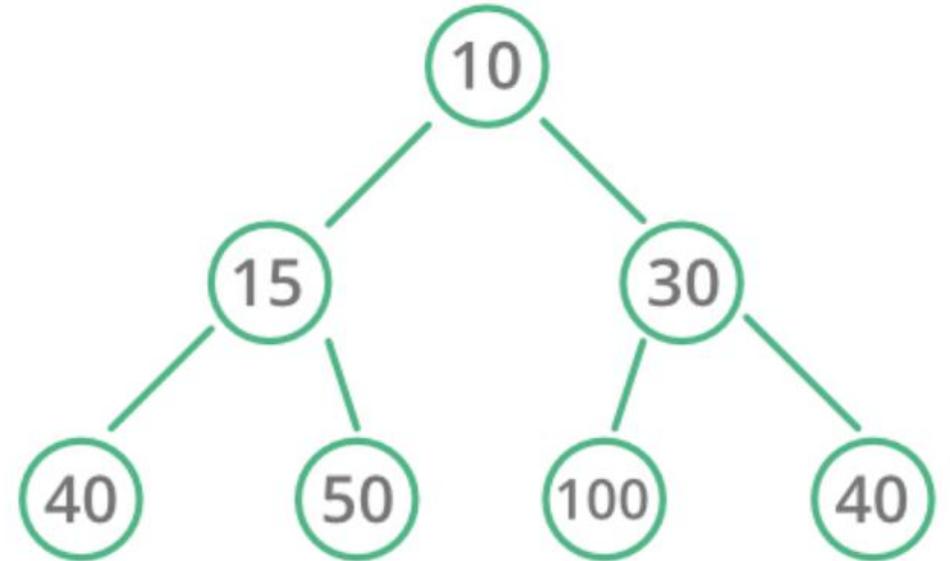
Adding Red/Black functionality to a BST does not affect the running time

You will never have to write code for a red black tree, but you should know the purpose of red black trees, and be able to verify if a red black tree is valid or not



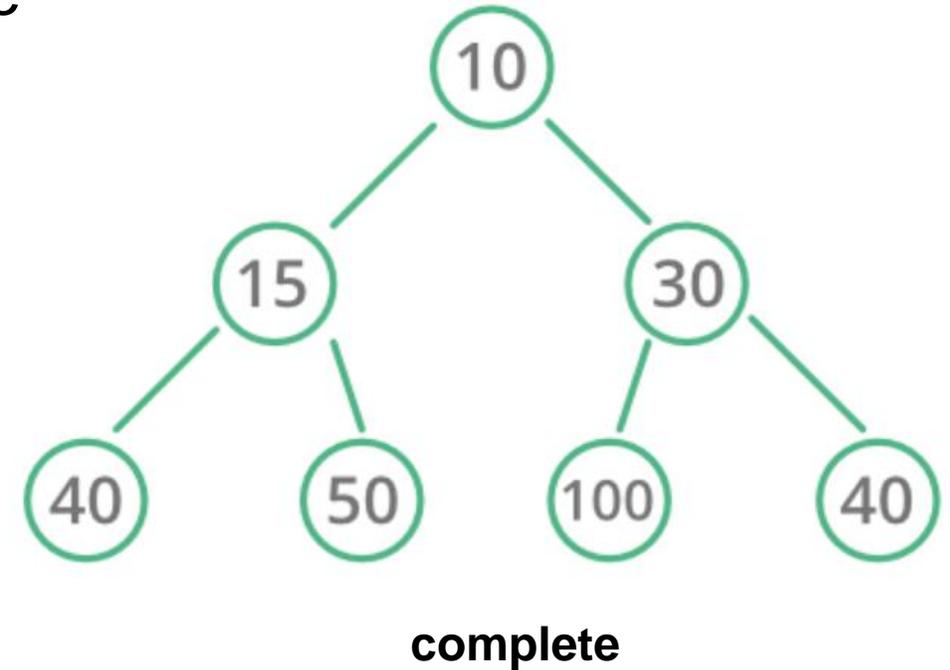
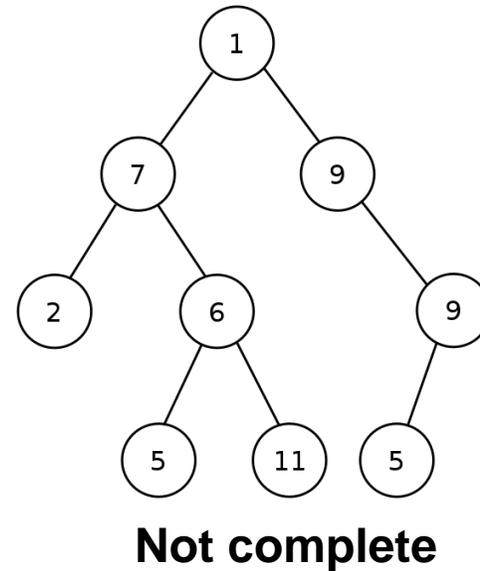
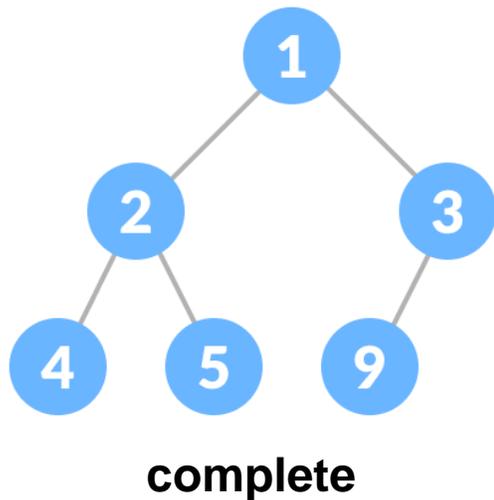
Binary Search Tree Java Library?

The **Heap** data structure is complete binary tree that follows the heap property



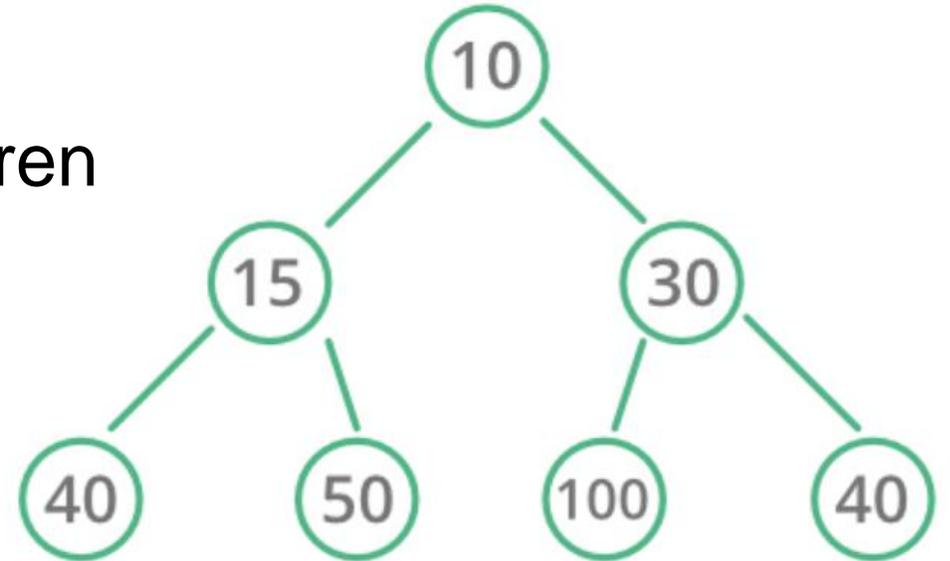
The **Heap** data structure is **complete** binary tree that follows the heap property

Complete tree - Every level, except possibly the last, is completely filled, and all nodes in the last level are as far left as possible



The **Heap** data structure is complete **binary** tree that follows the heap property

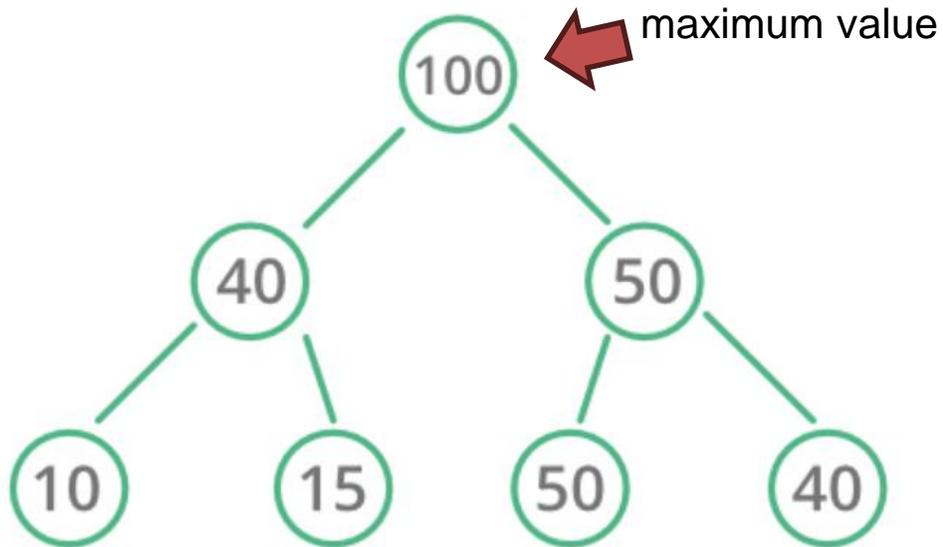
Binary – cannot have more than two children



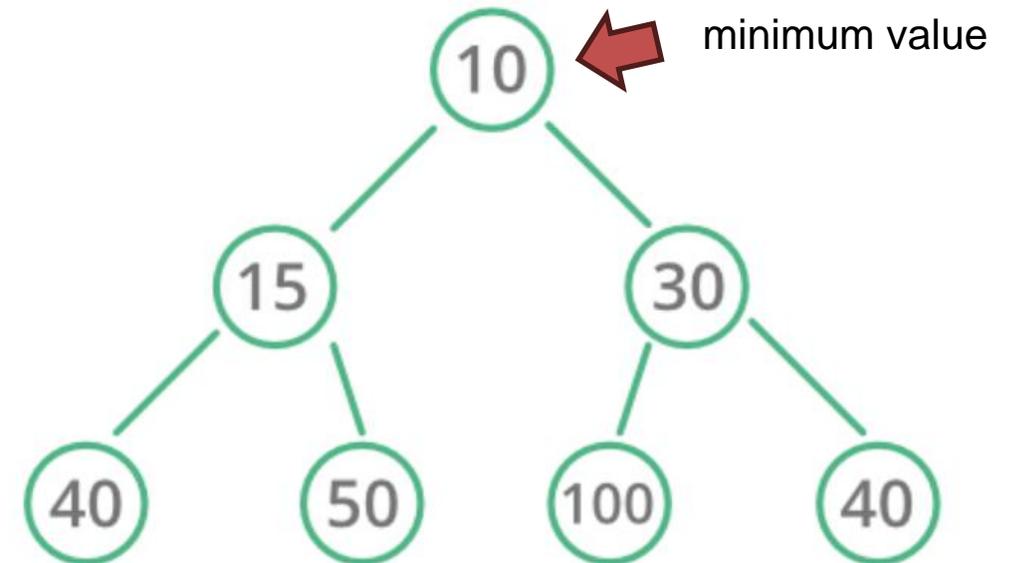
The **Heap** data structure is complete binary tree that follows the **heap property**

Two types of heaps

Max Heap – Parent nodes are greater than both of its children

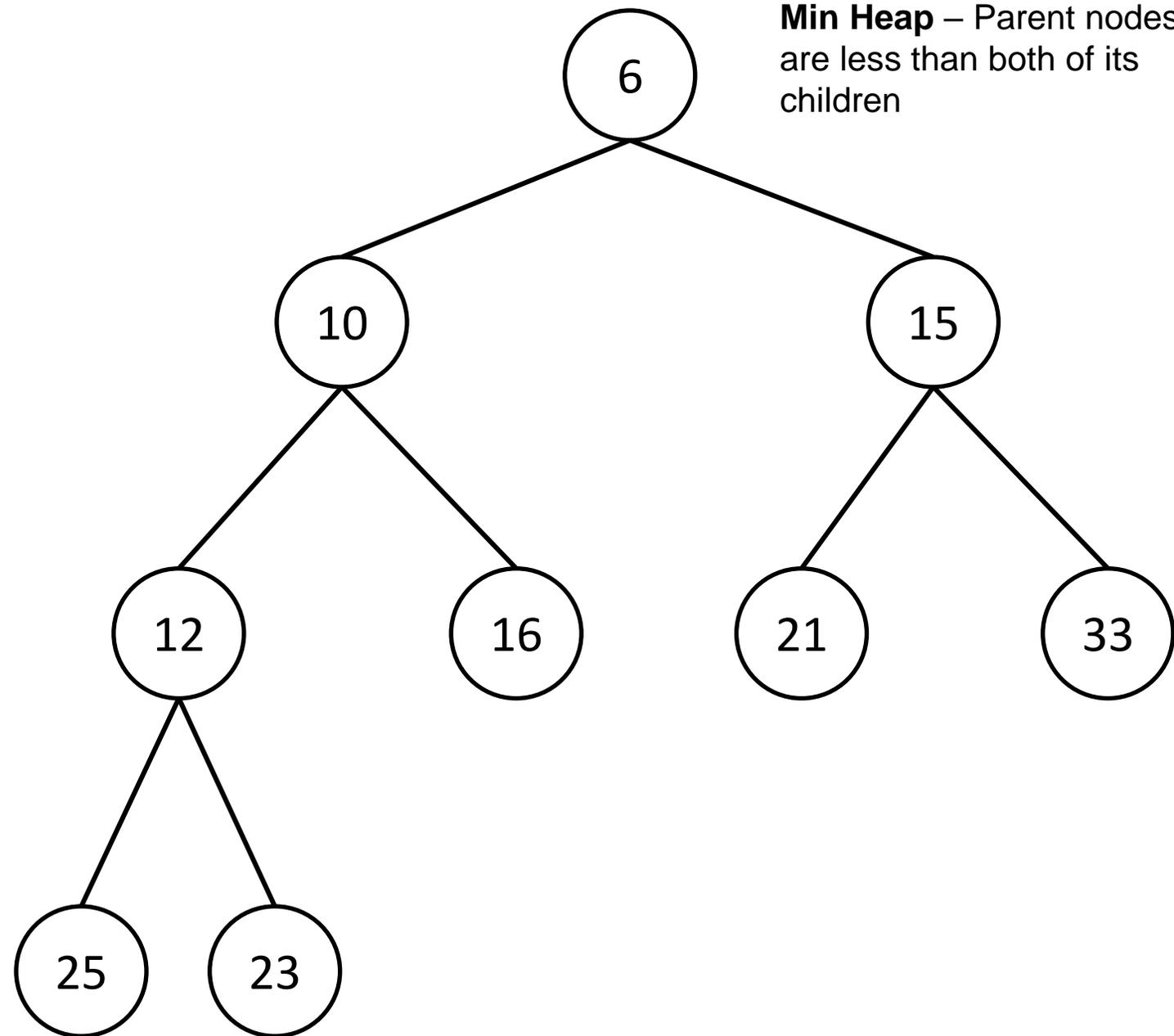


Min Heap – Parent nodes are less than both of its children



Heap Operations - Insert

`add(7);`

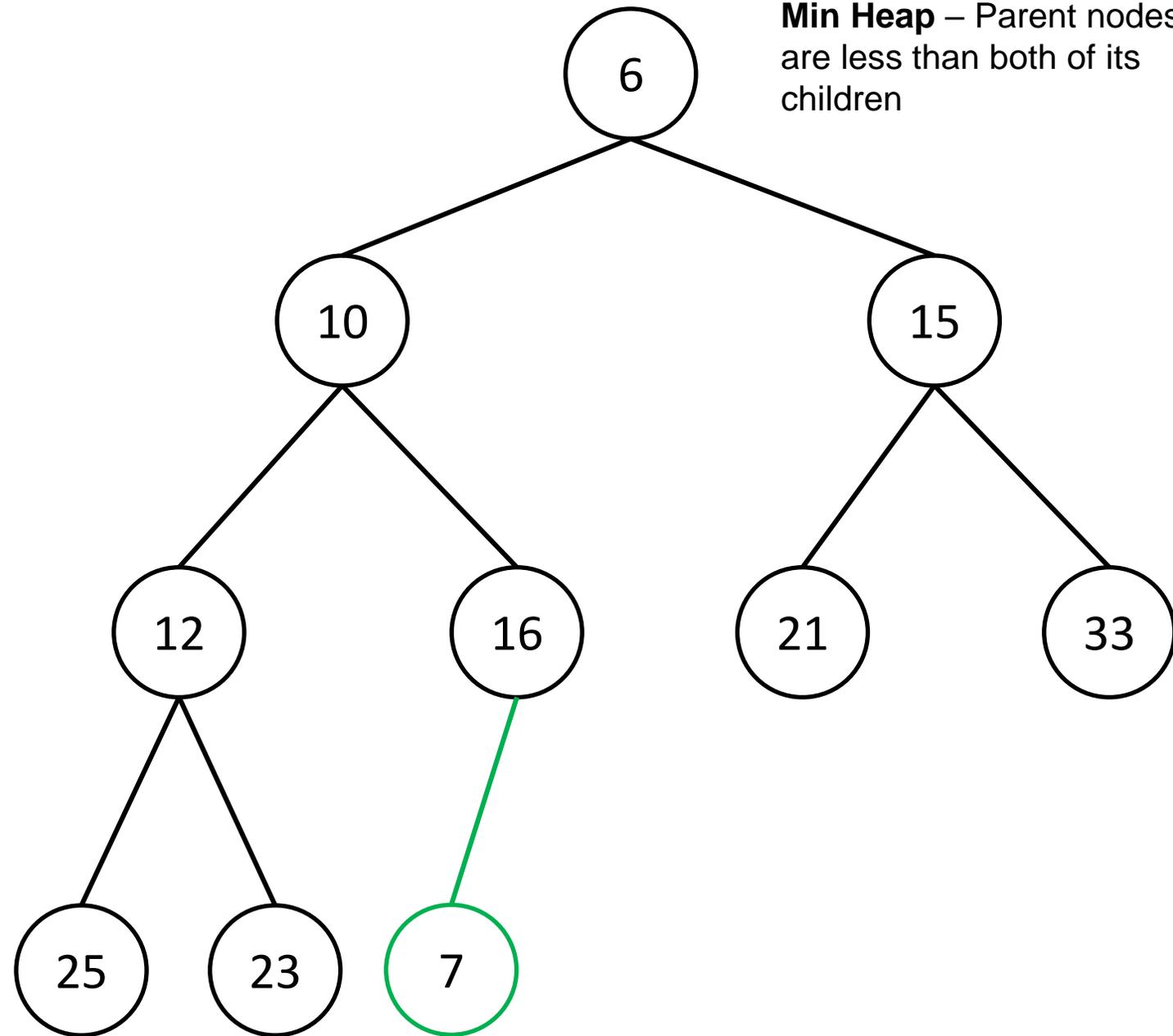


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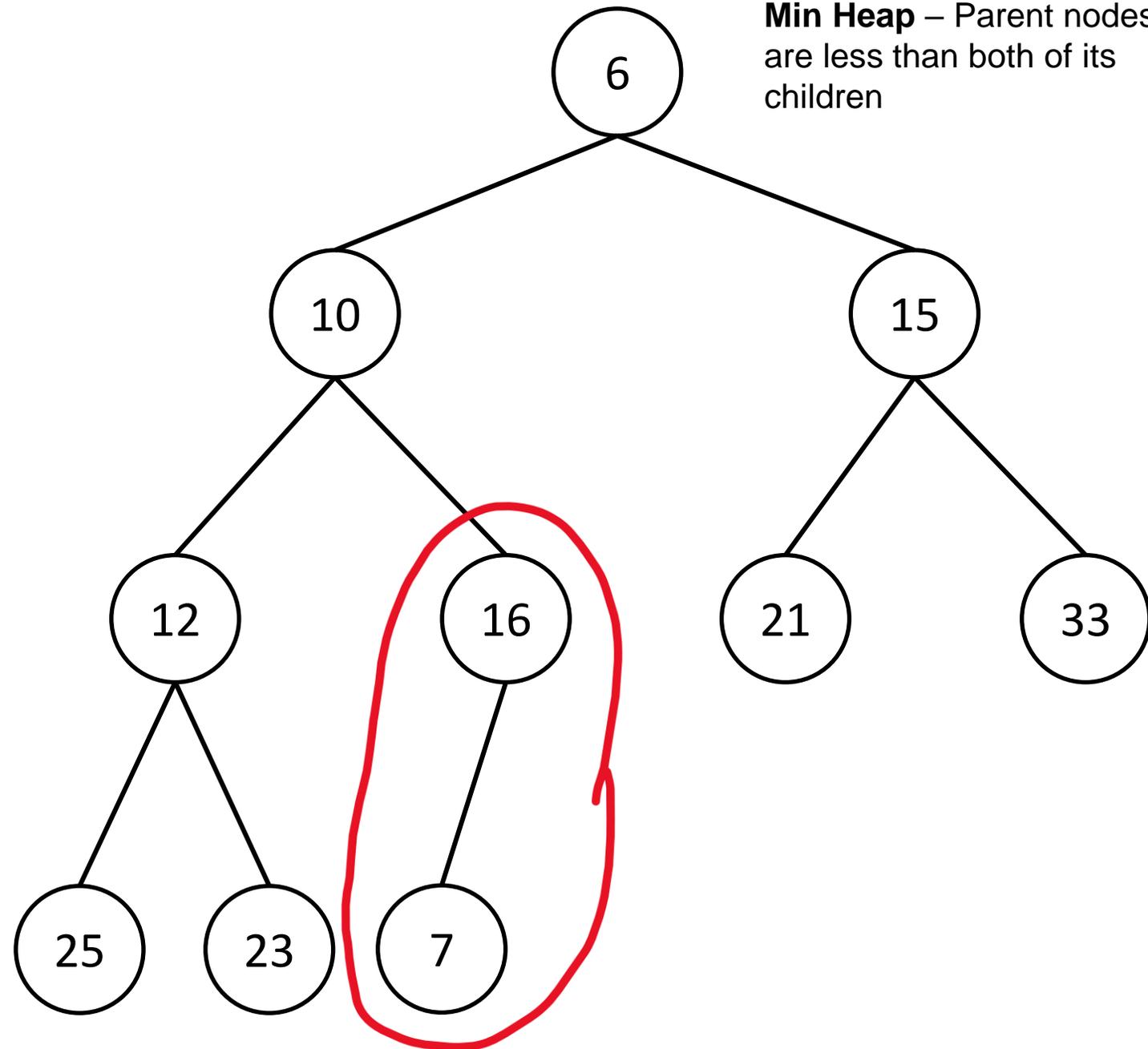
Because this is a complete binary tree, this is the only place a new node can go



Heap Operations - Insert

Min Heap – Parent nodes are less than both of its children

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Because this is a complete binary tree, this is the only place a new node can go

However, we are now violating the heap property

Heap Operations - Insert

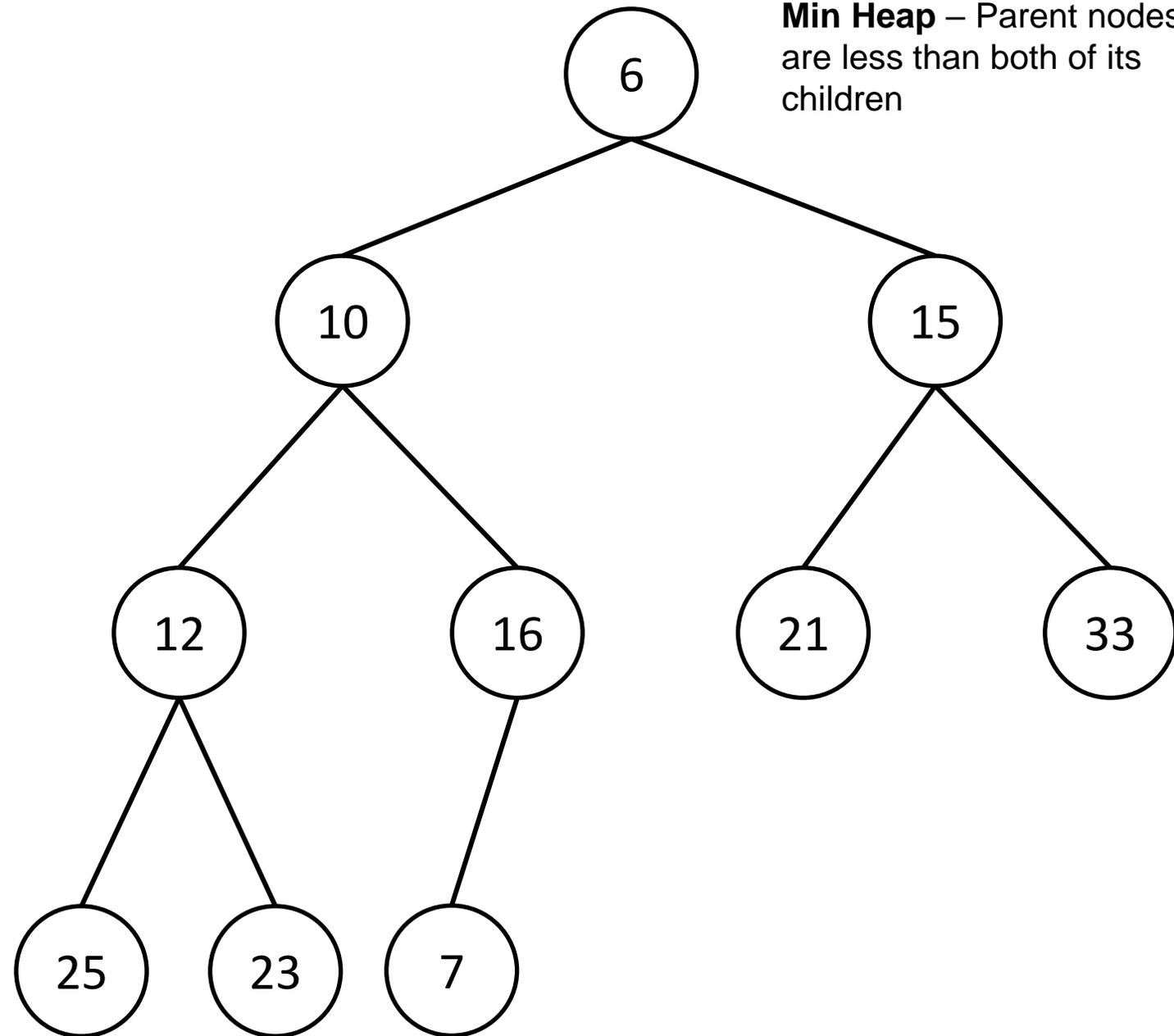
Min Heap – Parent nodes are less than both of its children

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Because this is a complete binary tree, this is the only place a new node can go

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When new nodes are added, we may need to move it up in the tree



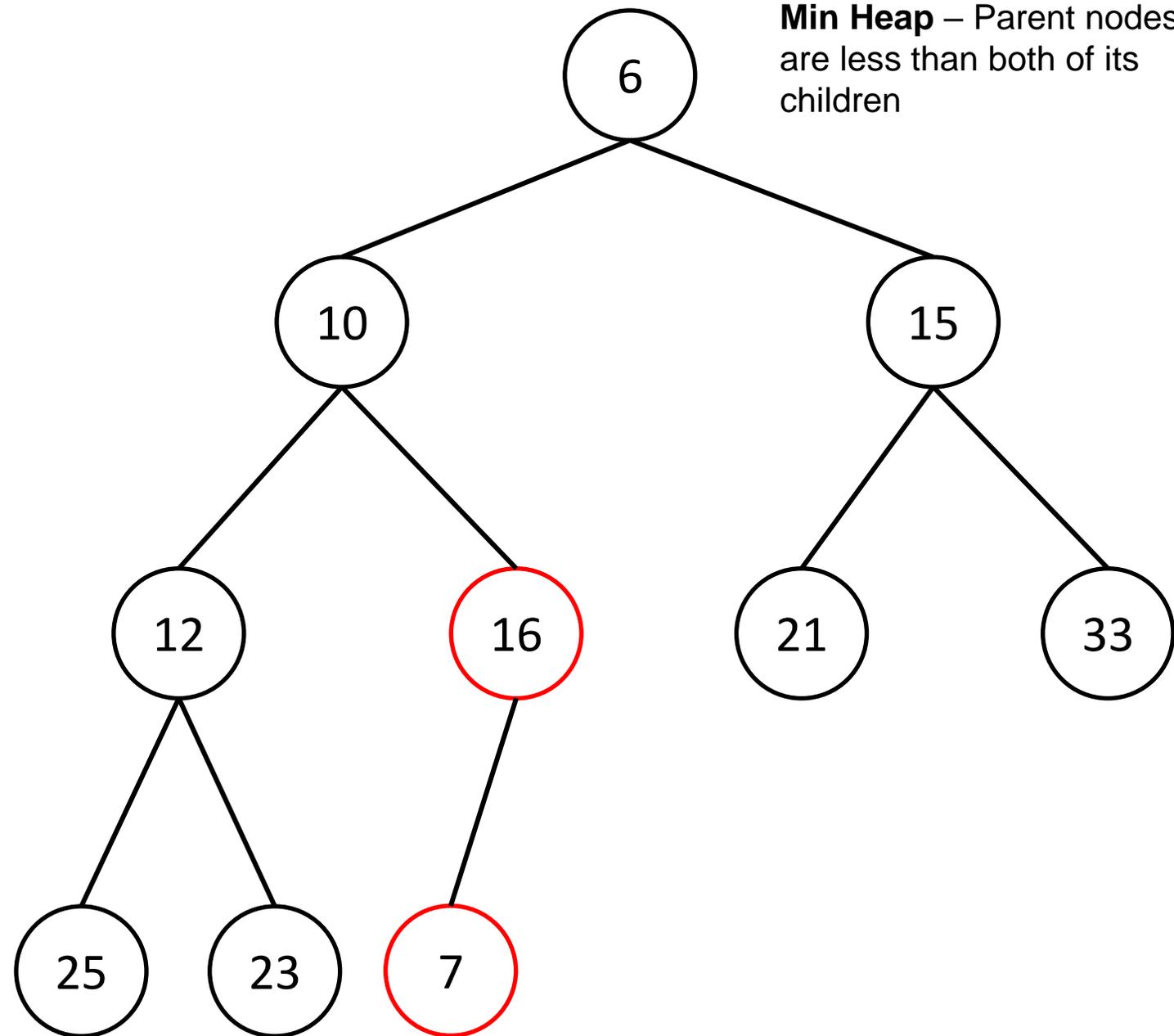
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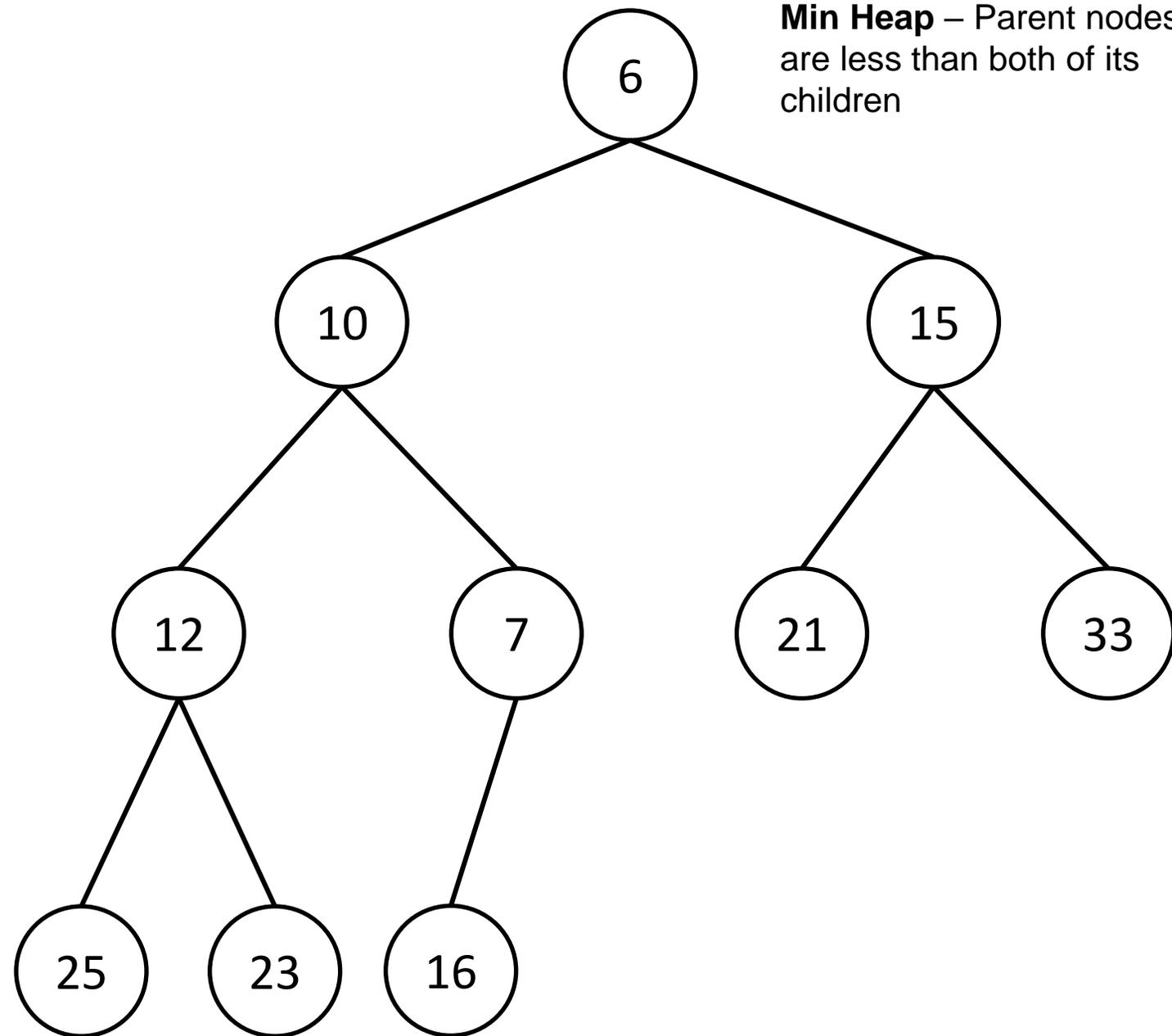
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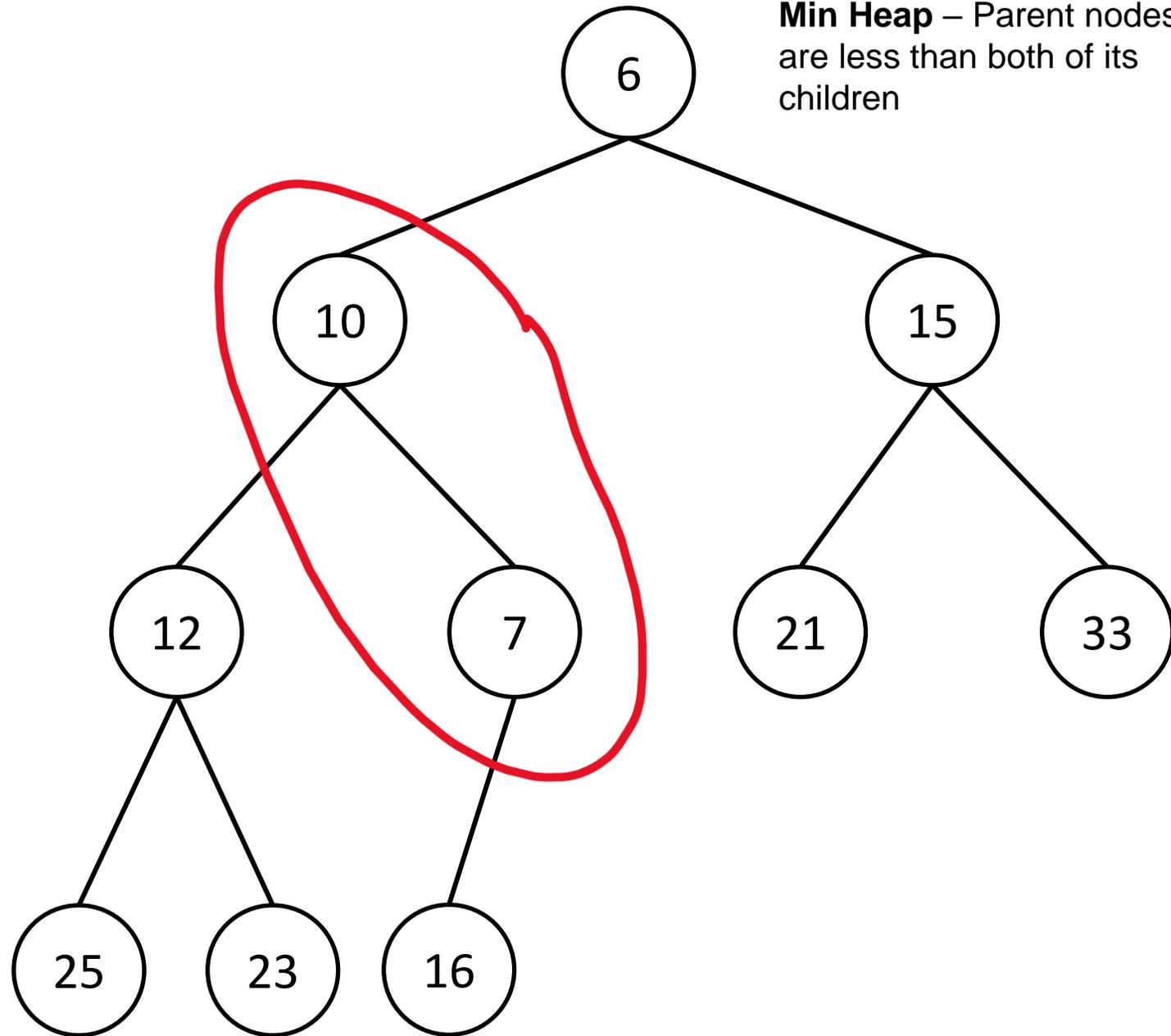
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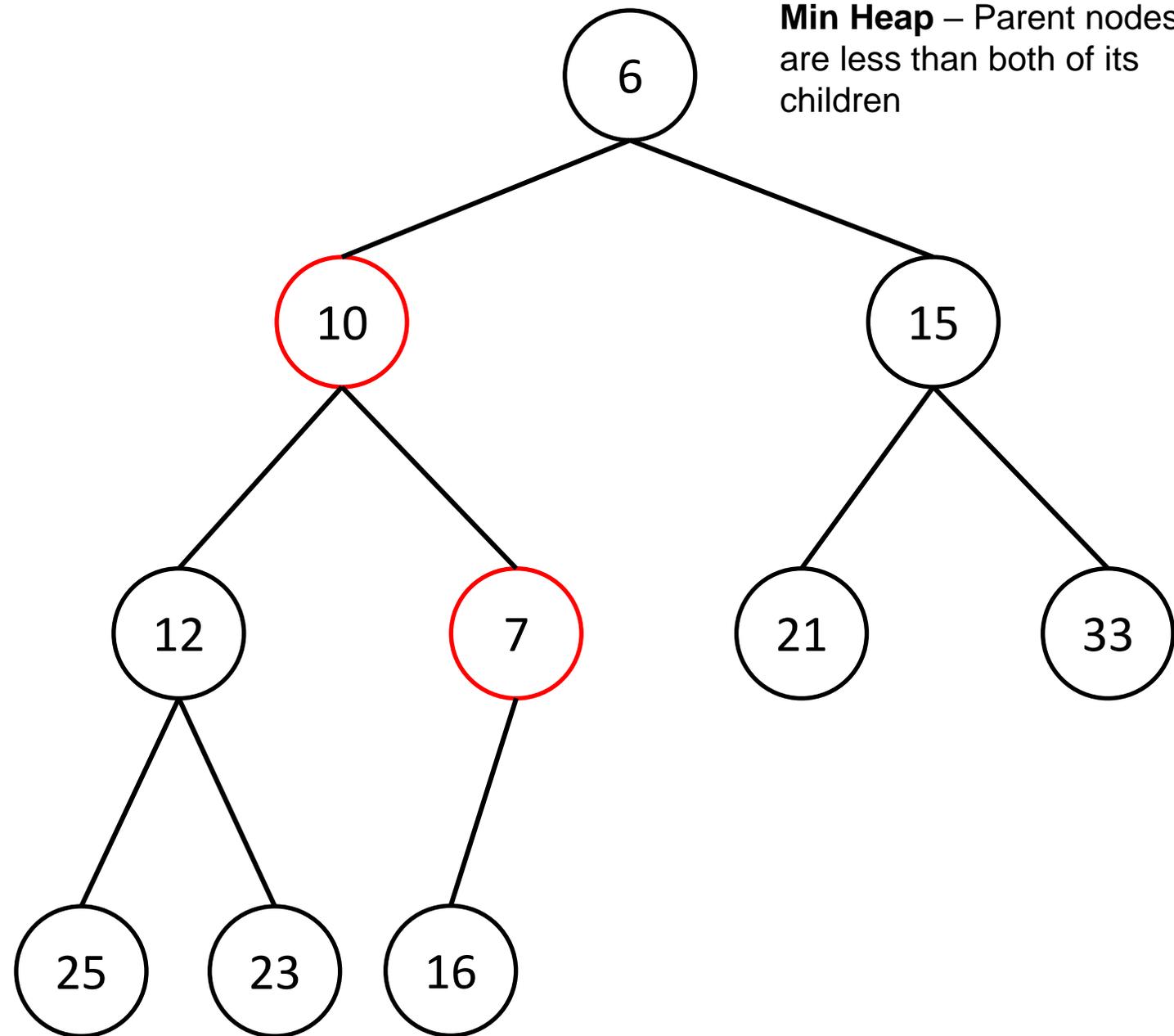
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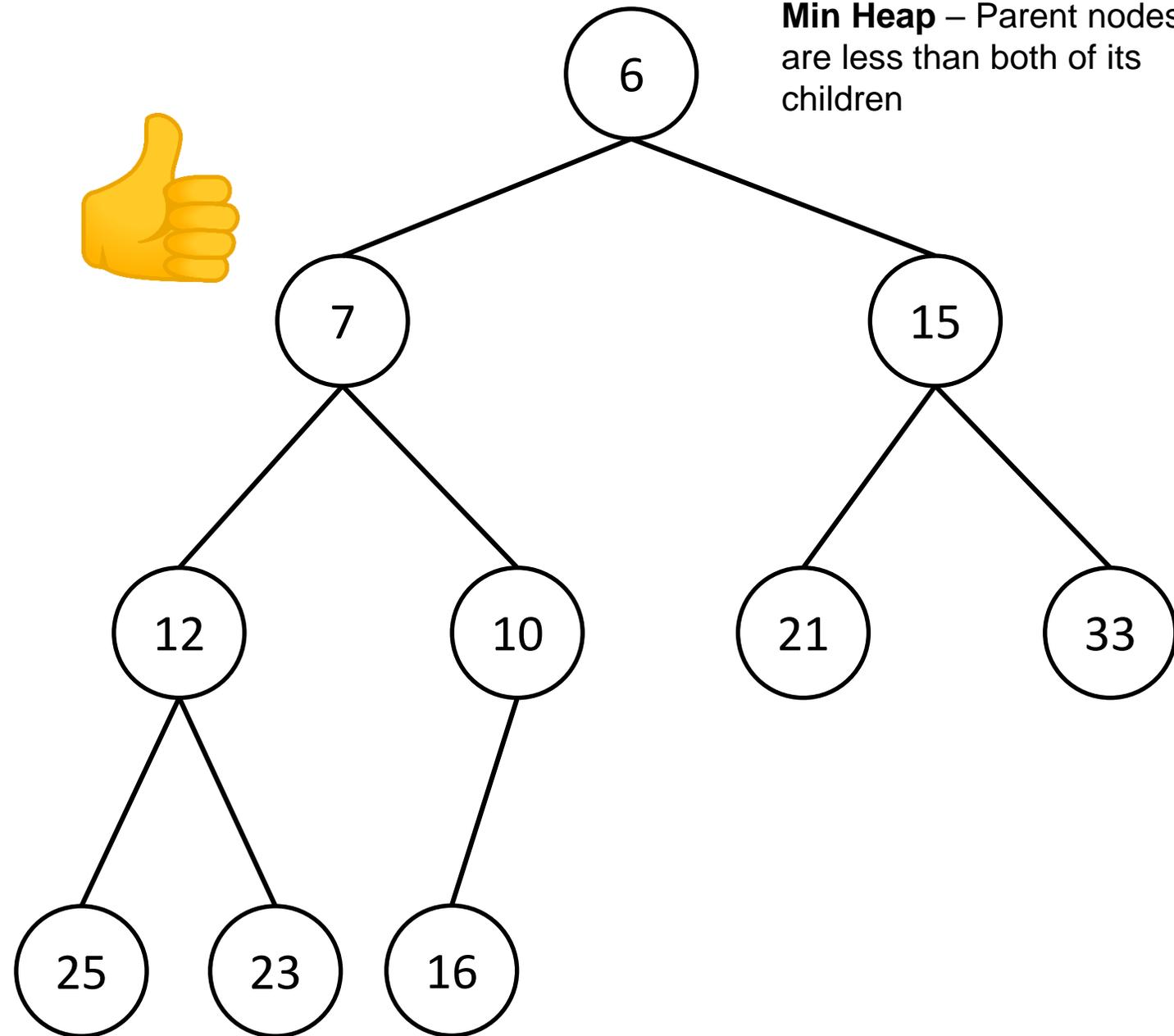
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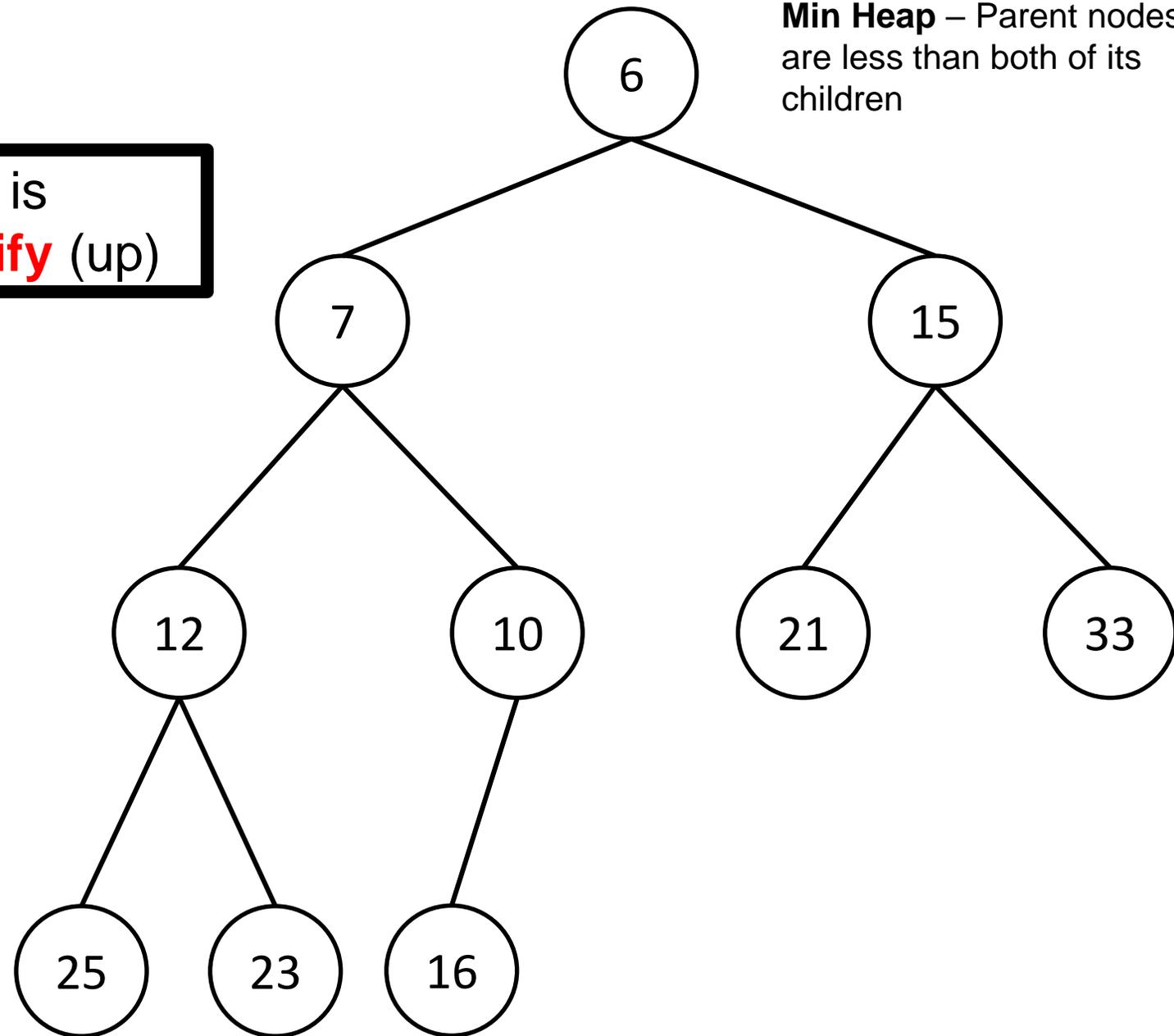
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Heap Operations - Insert

Min Heap – Parent nodes are less than both of its children

`add(7);`

This process is called **Heapify** (up)



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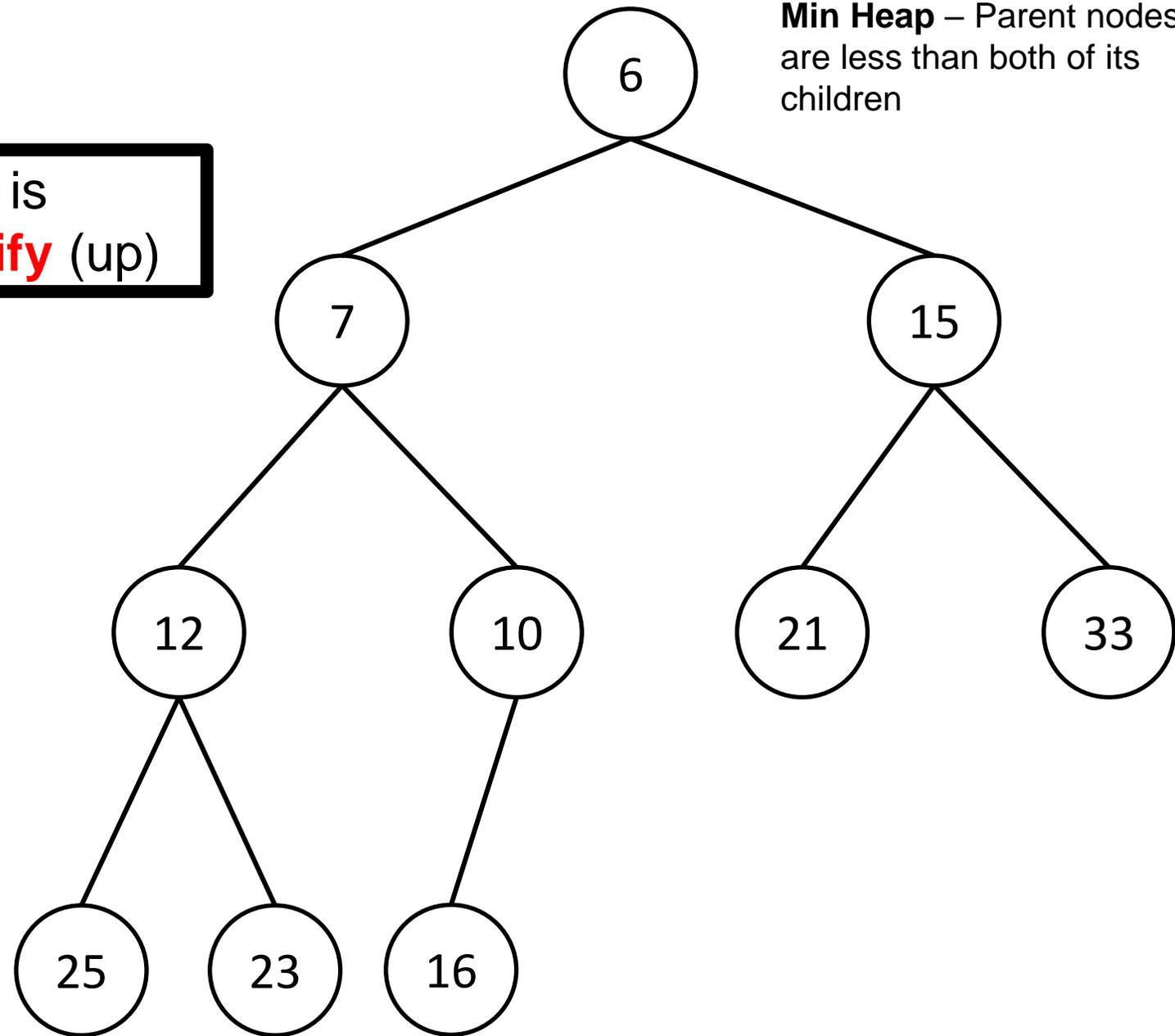
Heap Operations - Insert

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add(7);

add(14);

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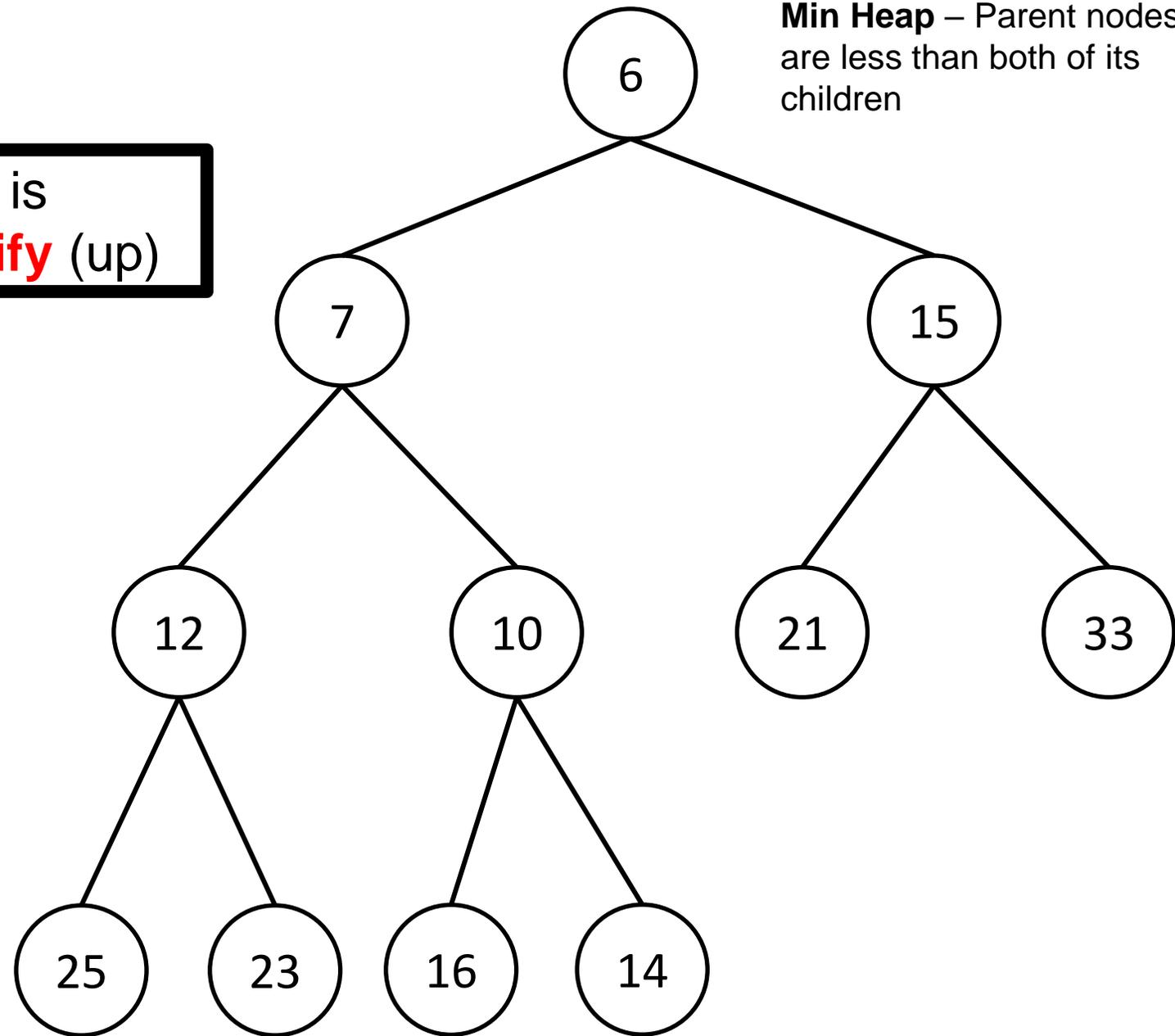
Heap Operations - Insert

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Heap Operations - Insert

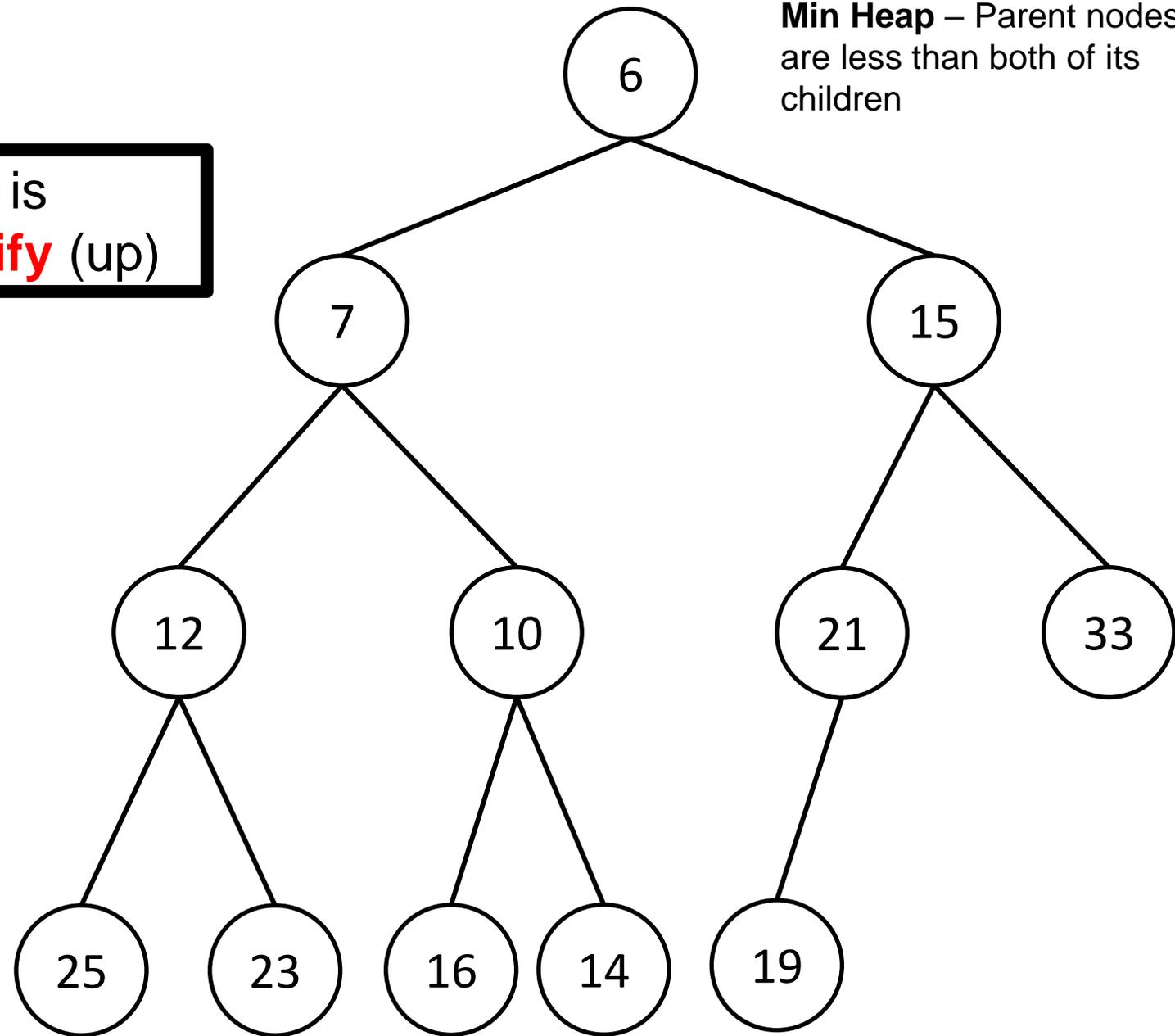
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Heap Operations - Insert

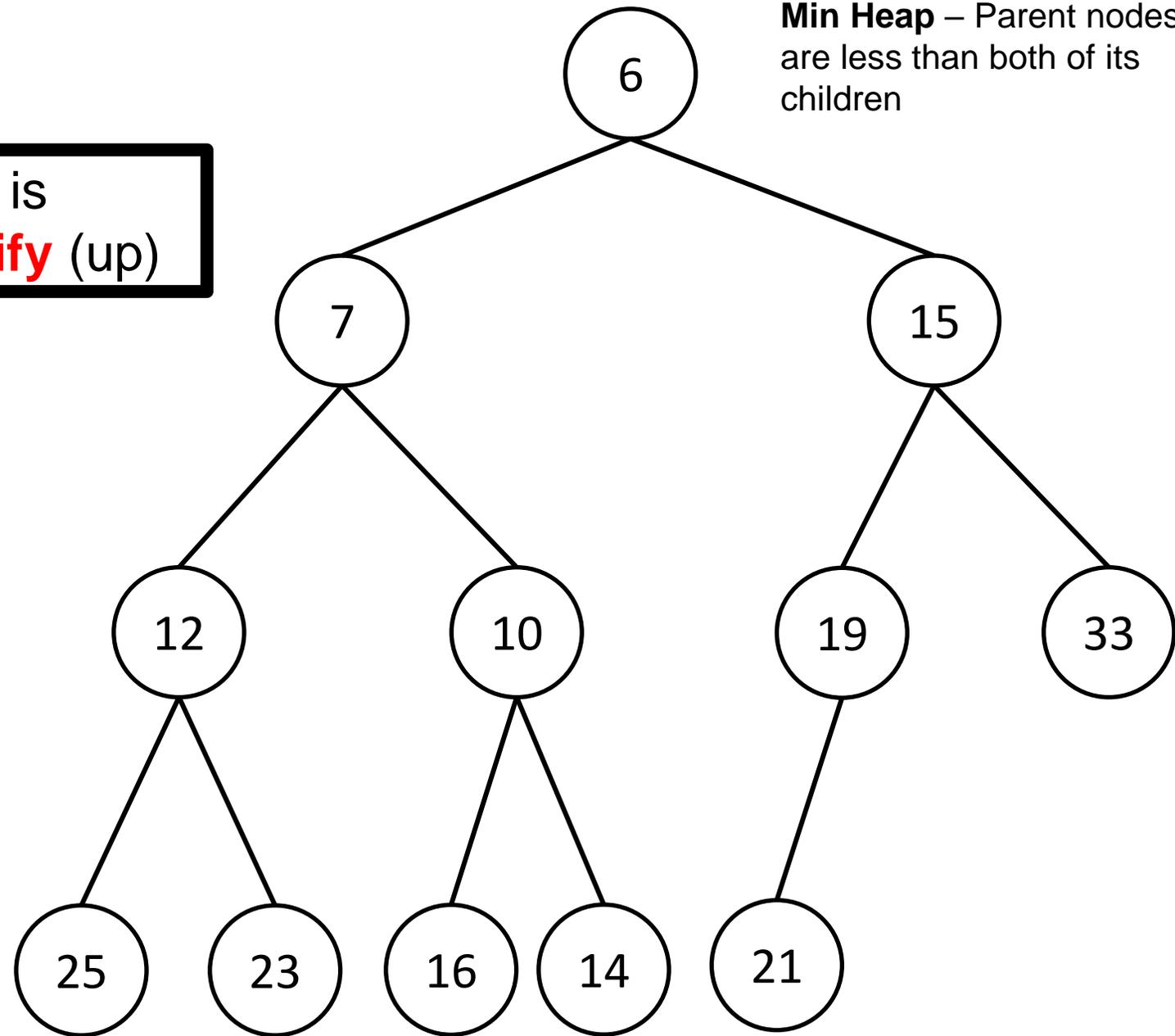
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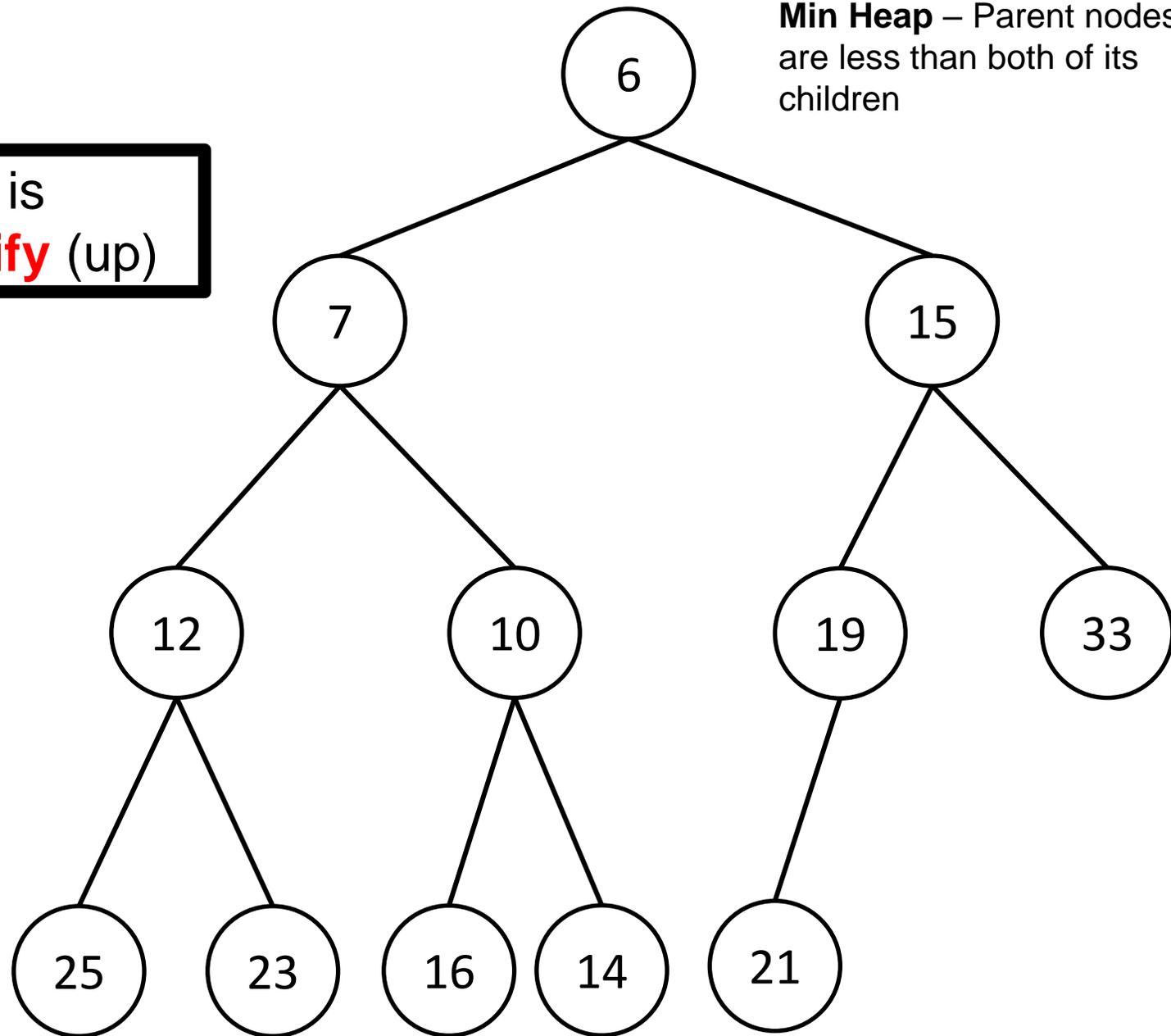
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Running time?

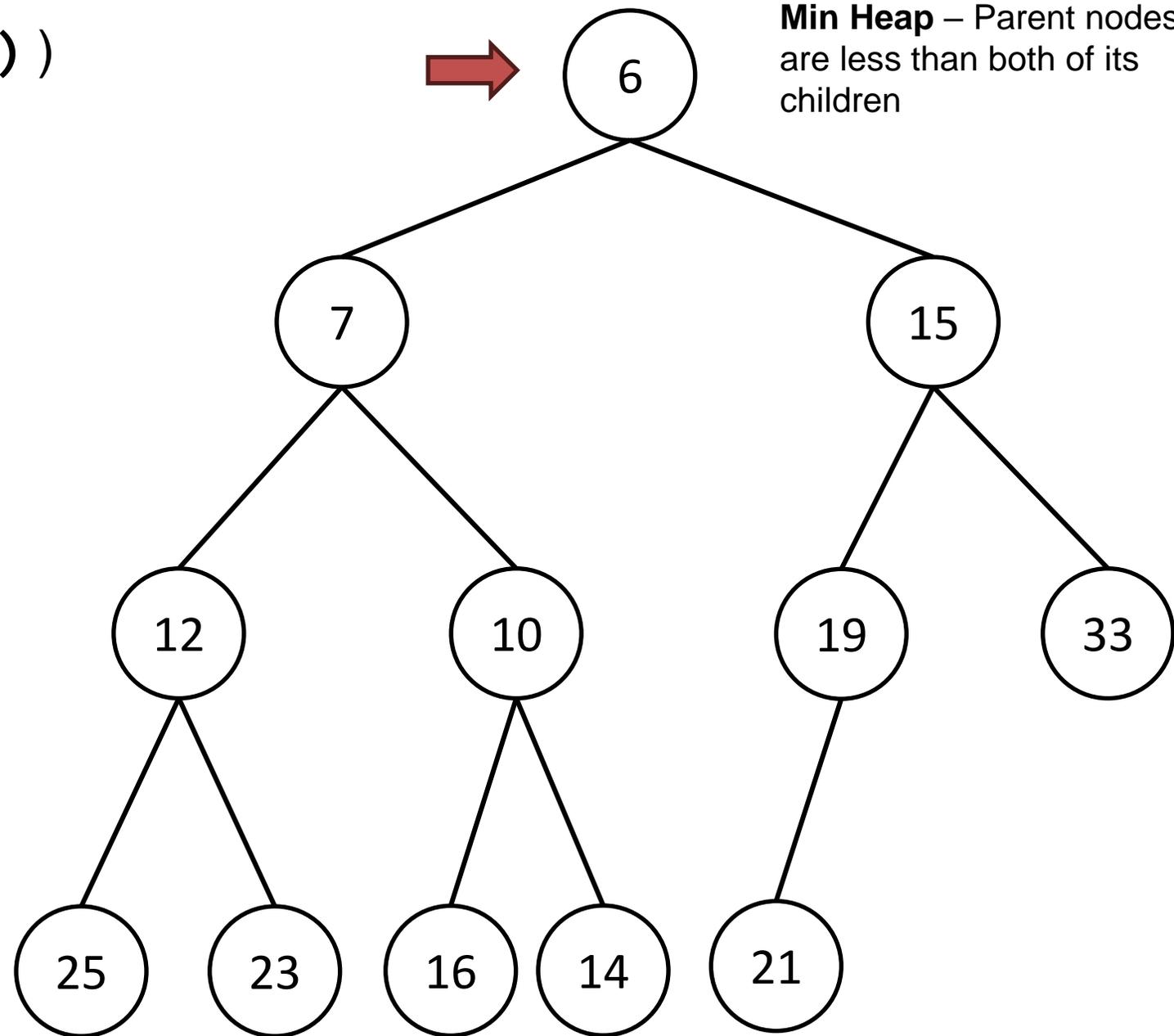
- Finding where to place new node: **$O(1)$** (this will make sense later)
- Insertion – **$O(1)$**
- Heapify Up – **$O(\log n)$**

Total Running Time: **$O(\log n)$**



Heap Operations – Removal (`poll()`)

When using a Heap, we only remove the root node, which will be either the maximum value or minimum value

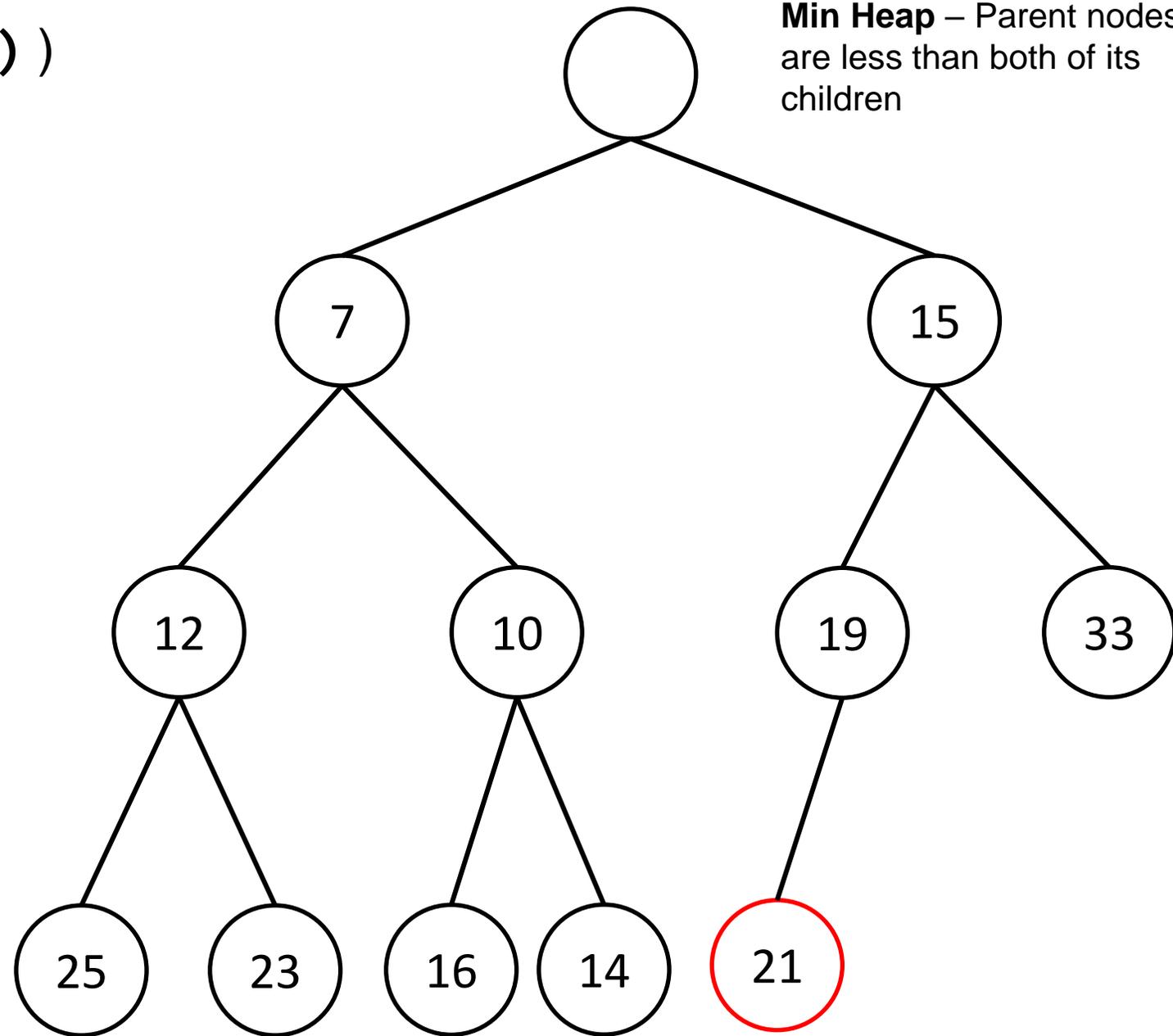


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When the root is removed, we replace it with **the last node that was added to the heap**

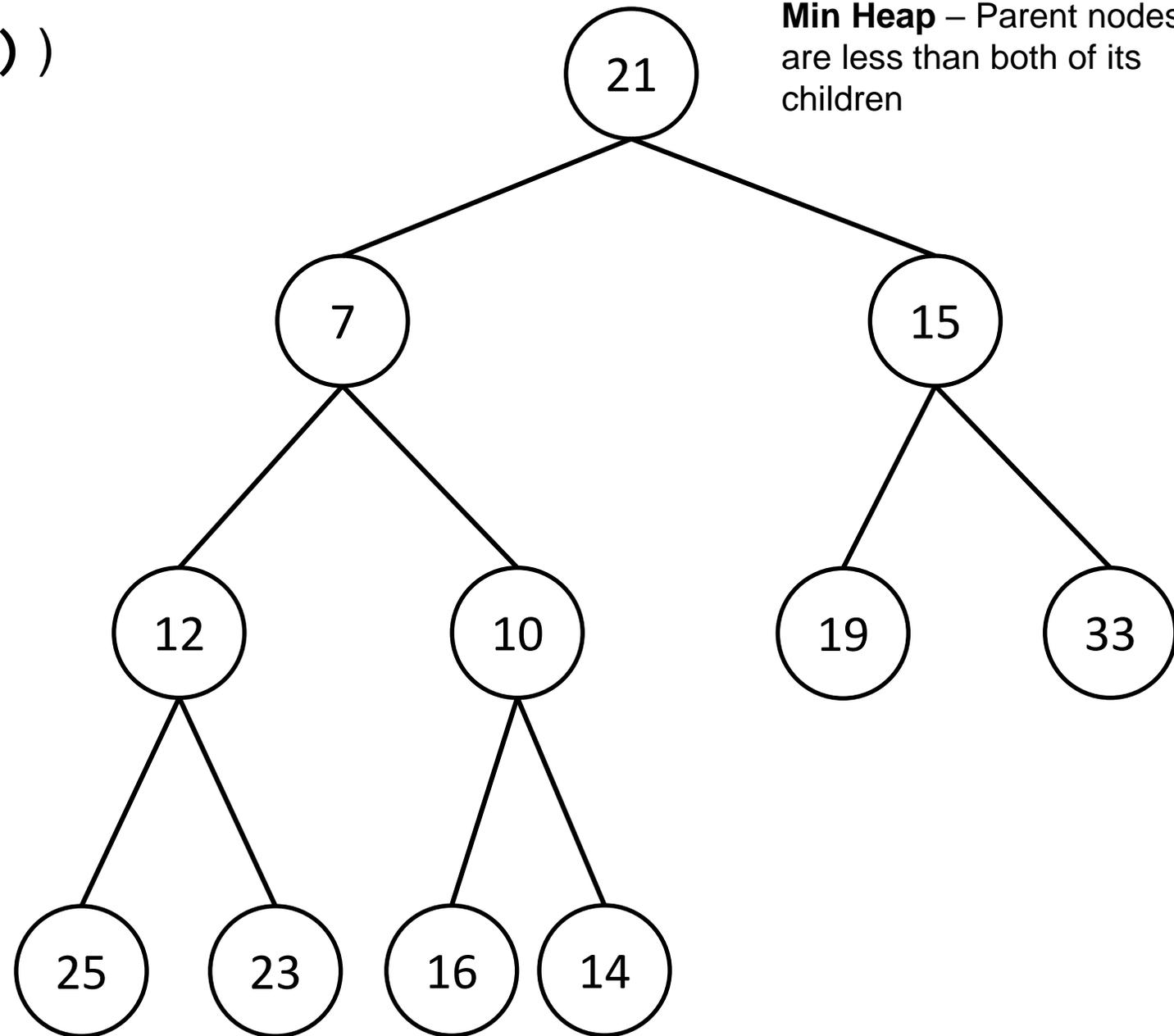


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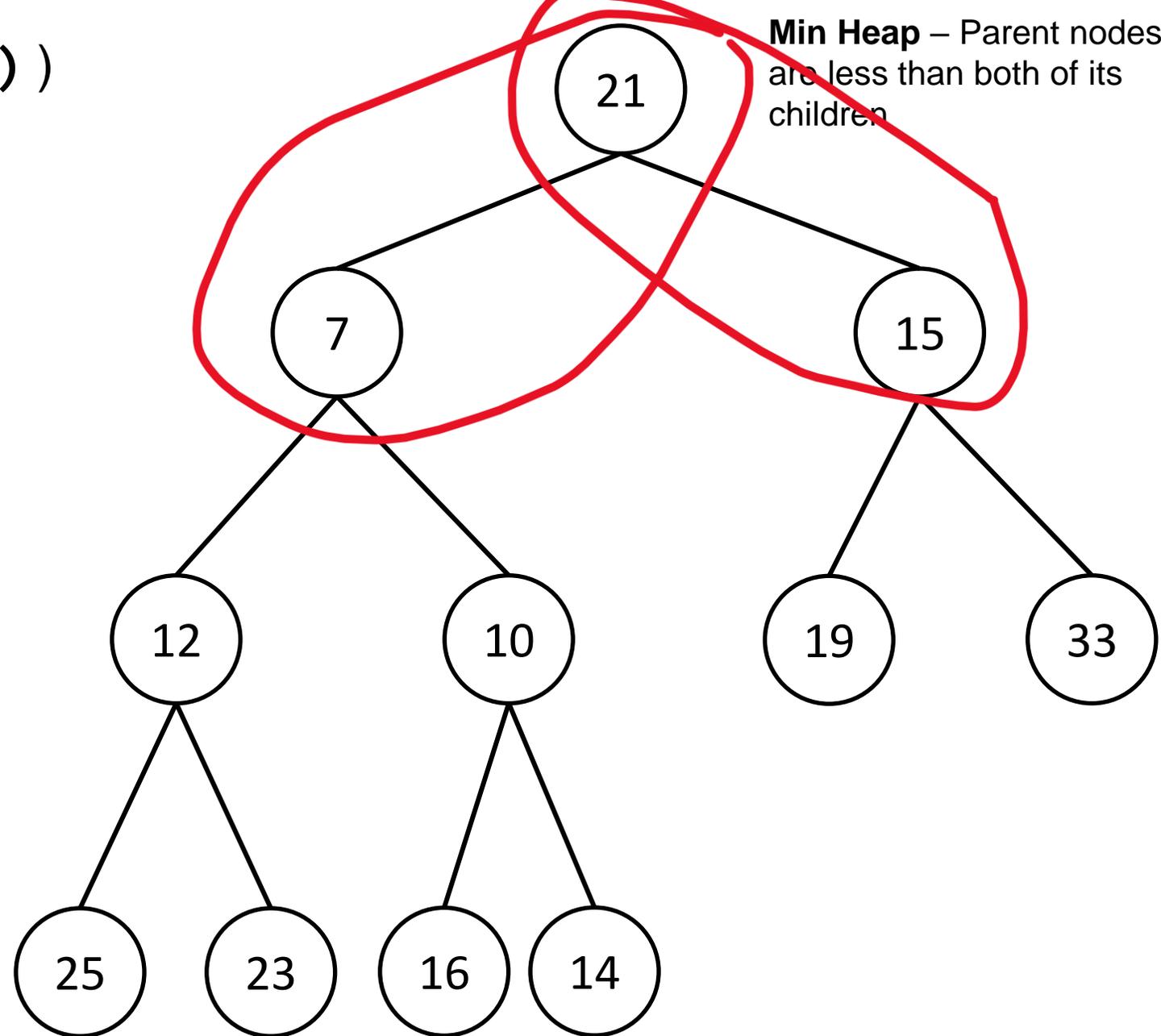
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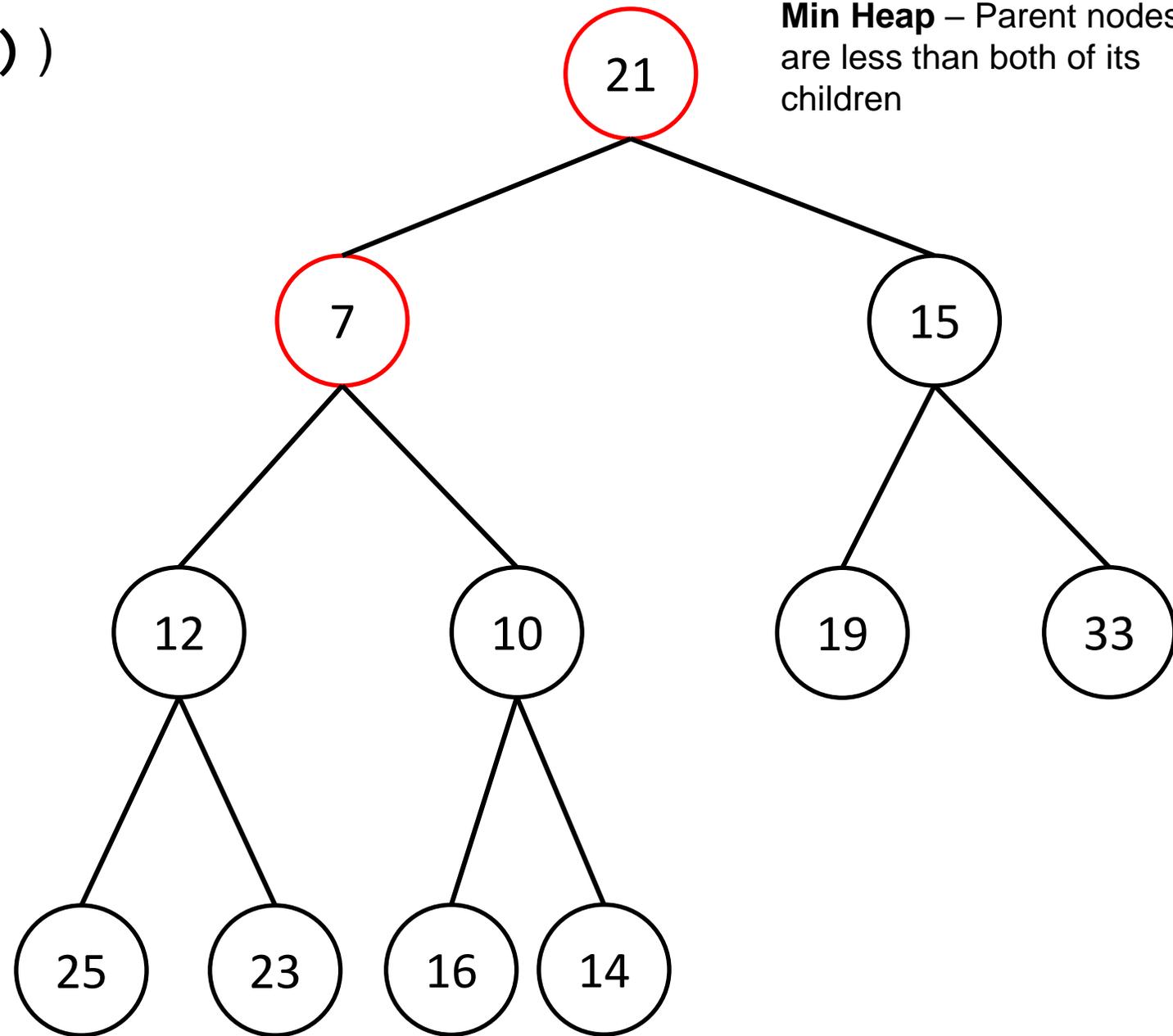
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When the root is replaced, it may need to be moved down in the tree



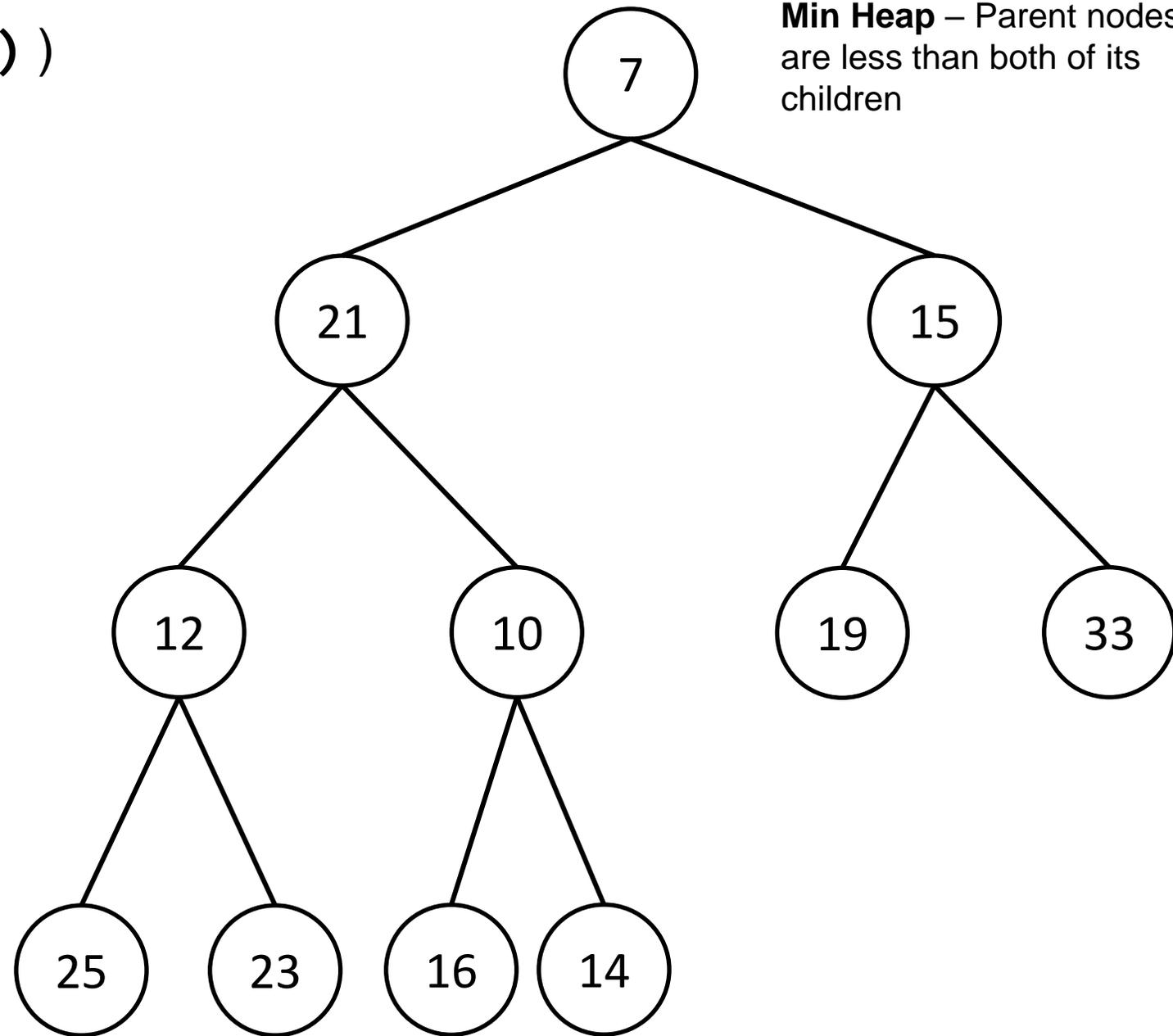
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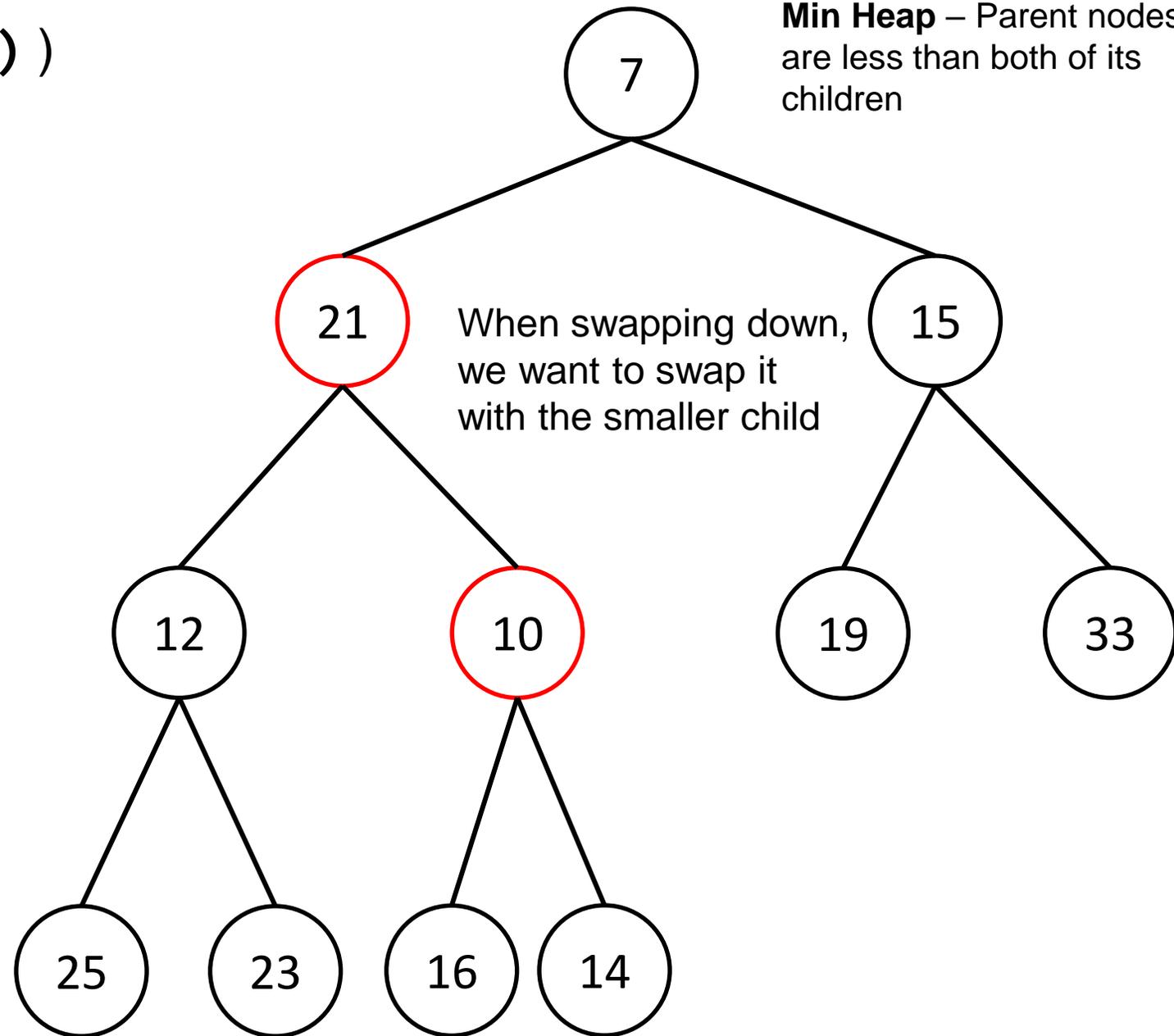
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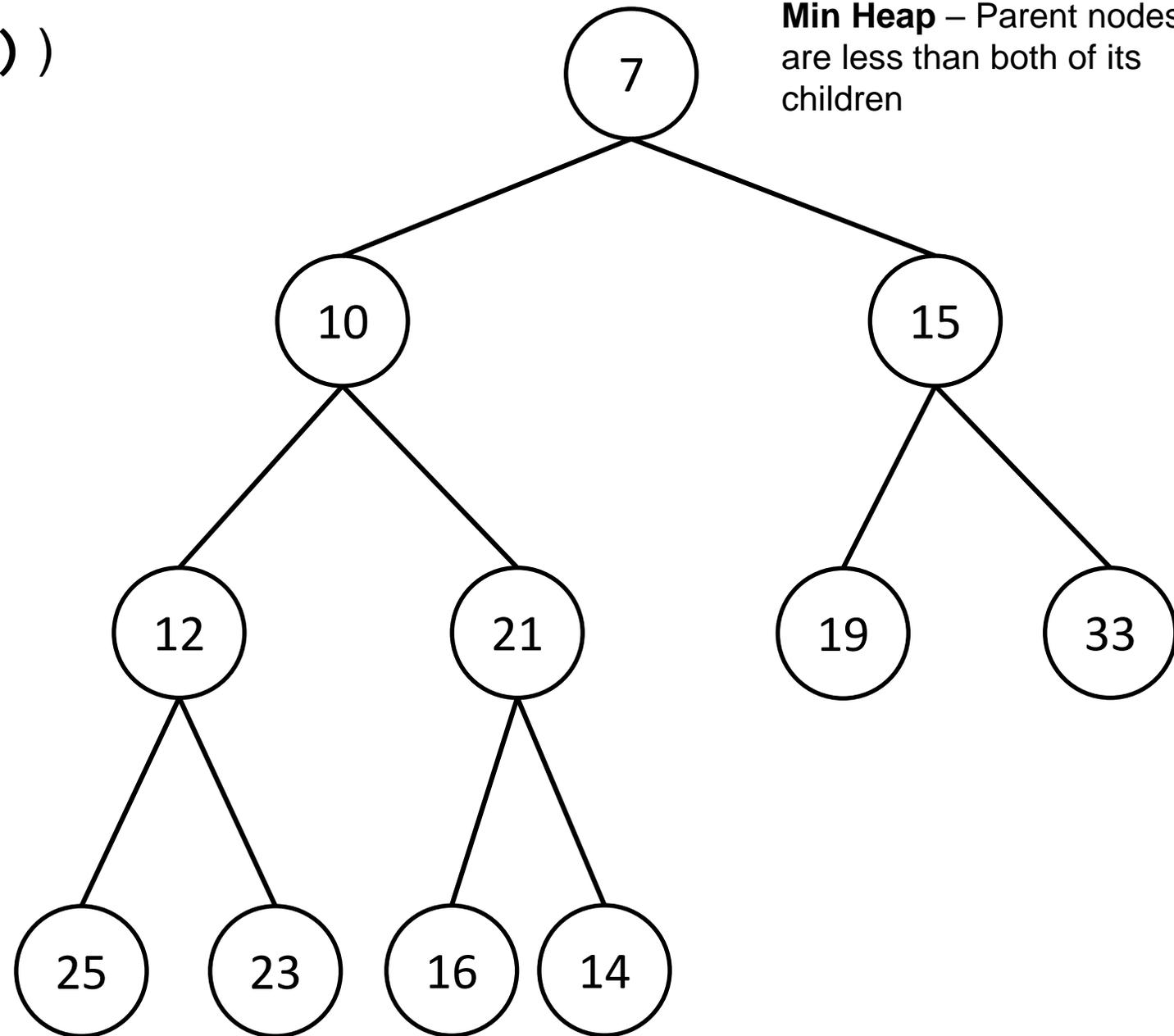
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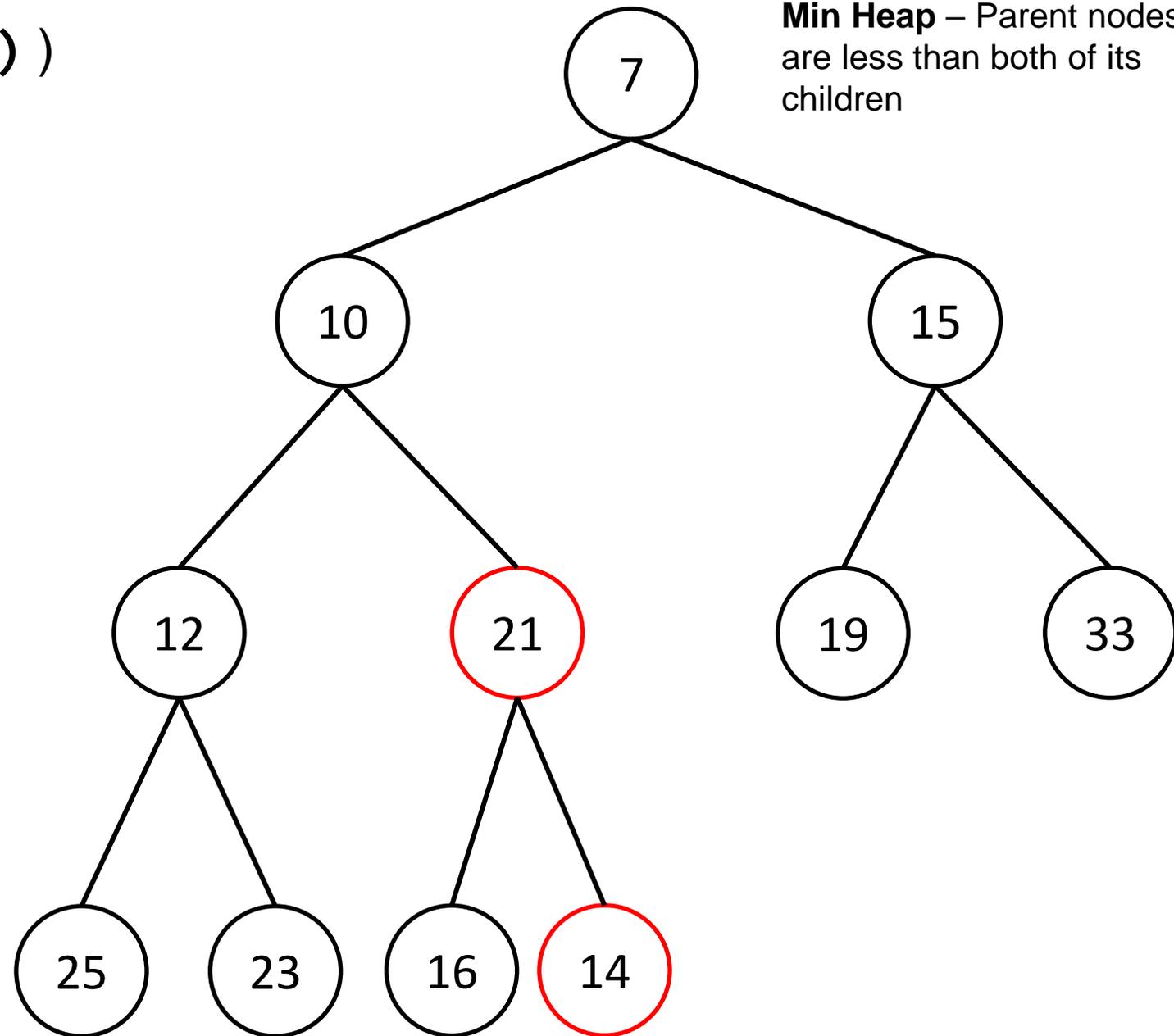
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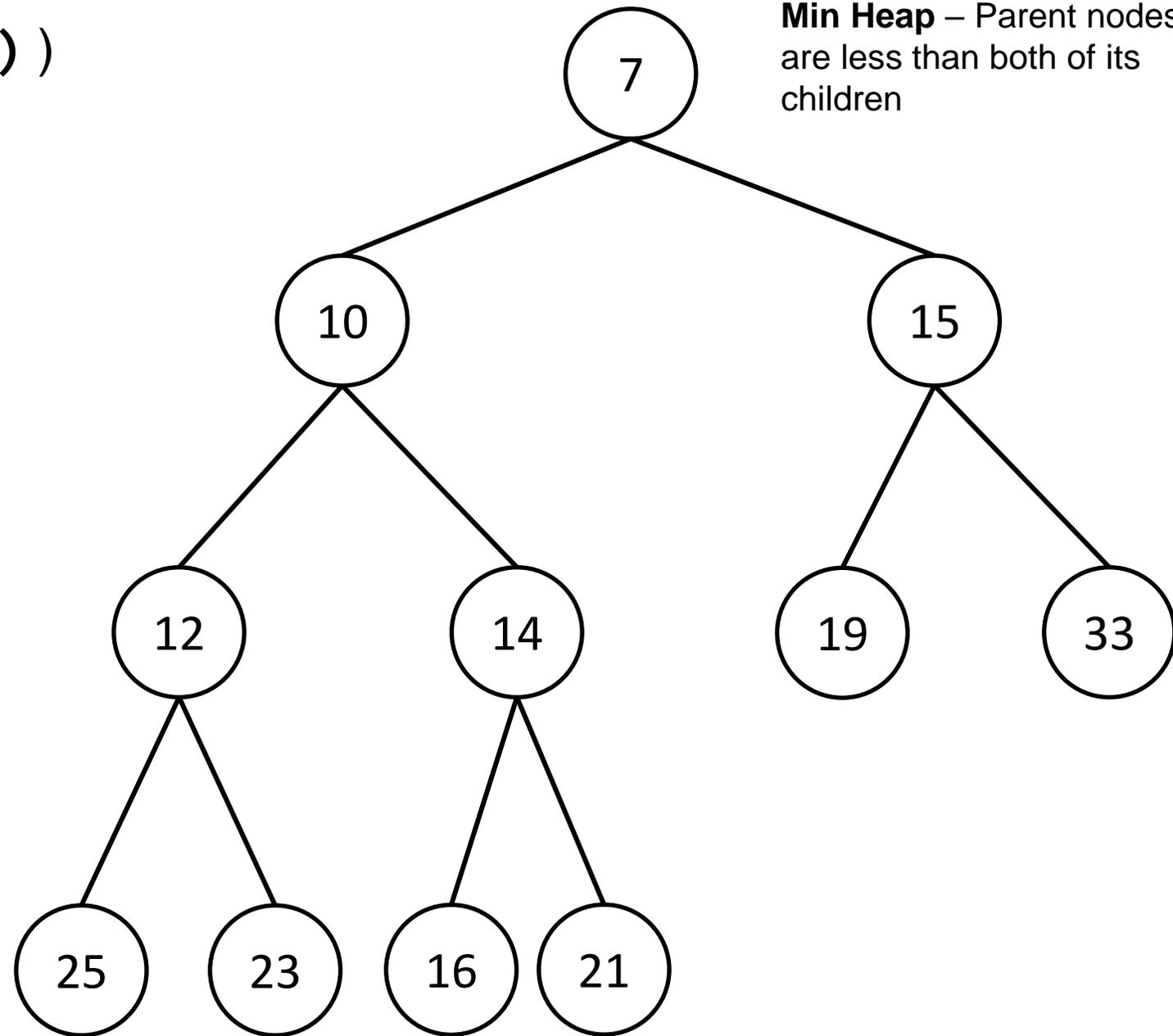
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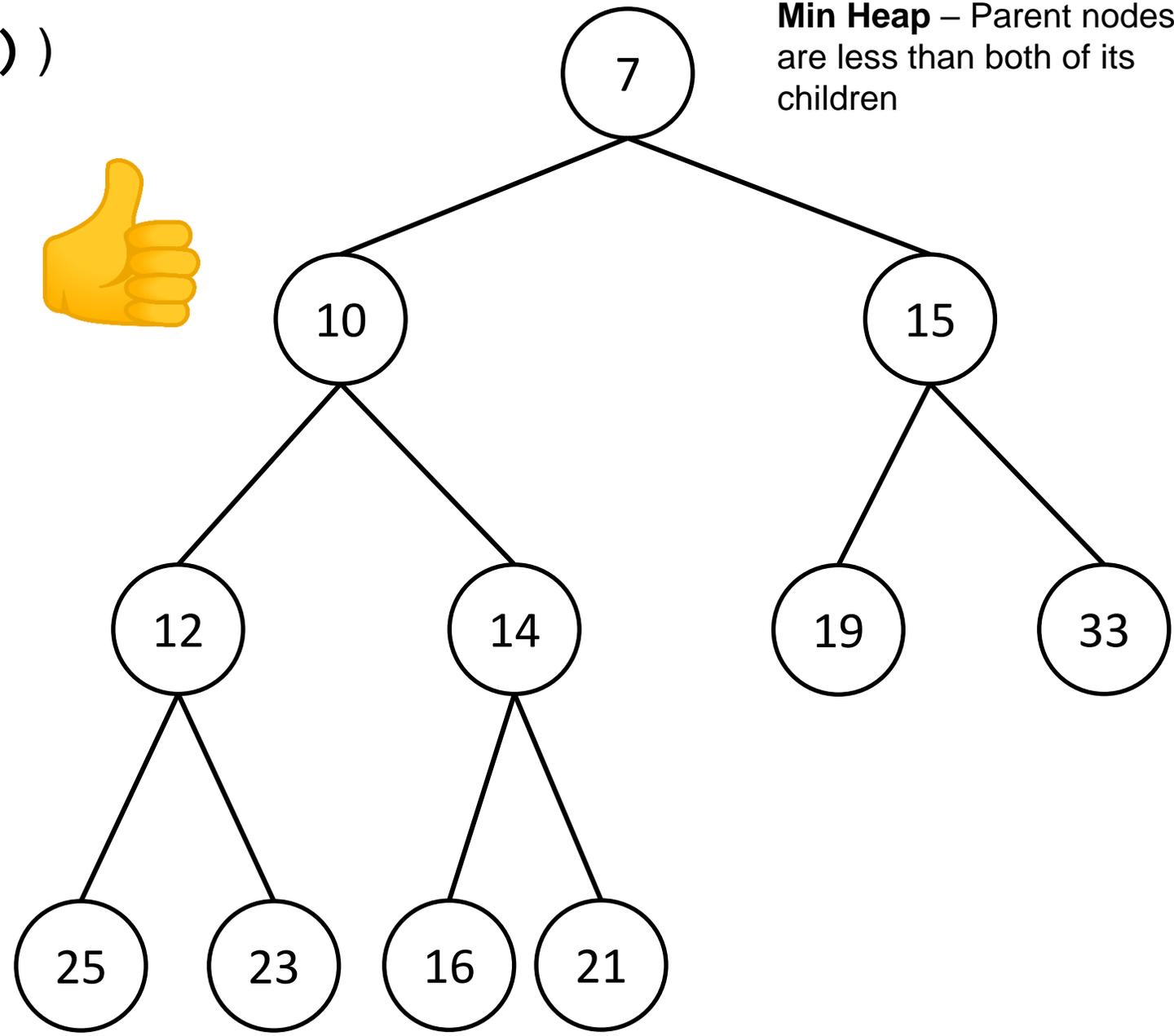
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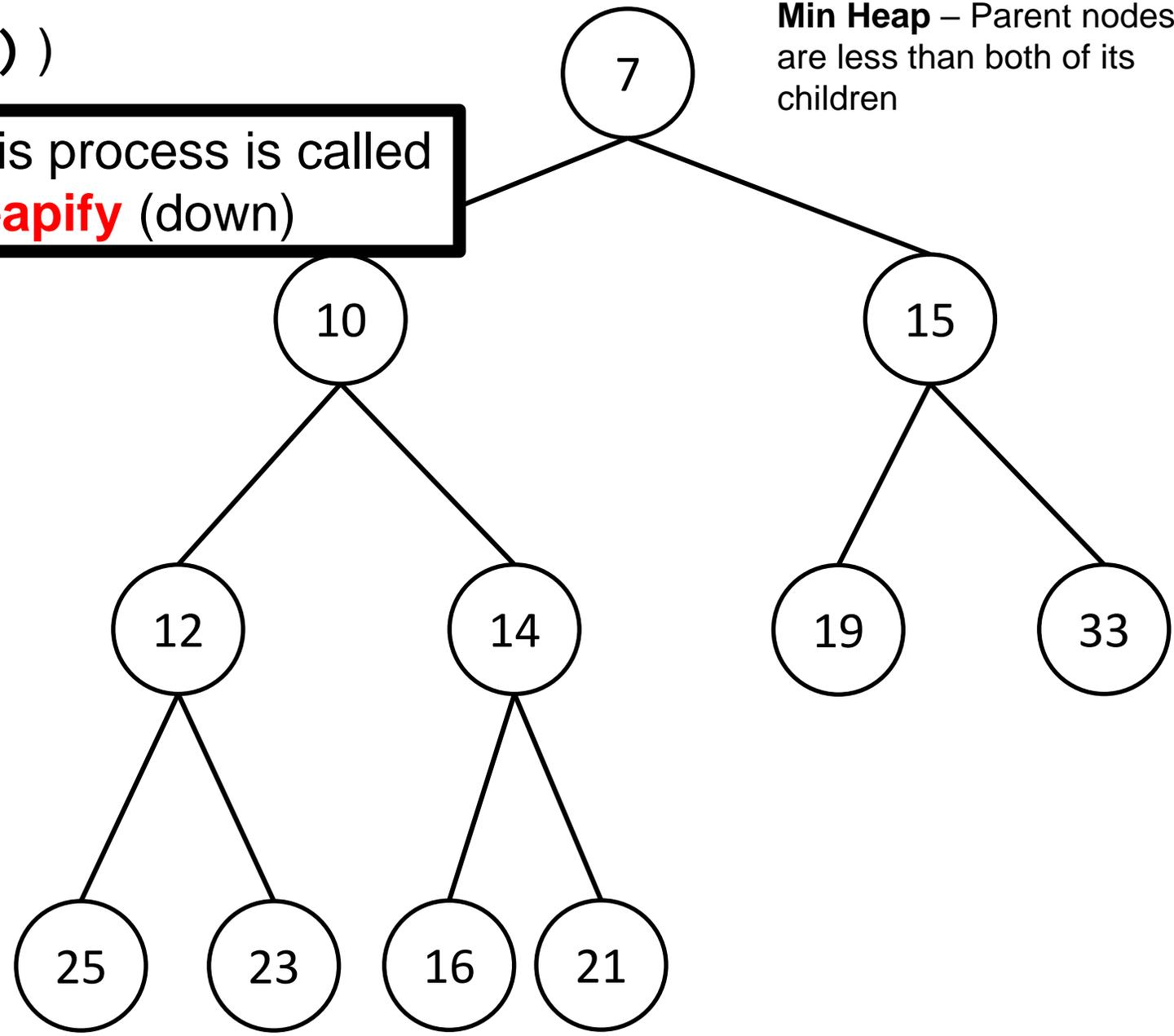
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This process is called **Heapify** (down)



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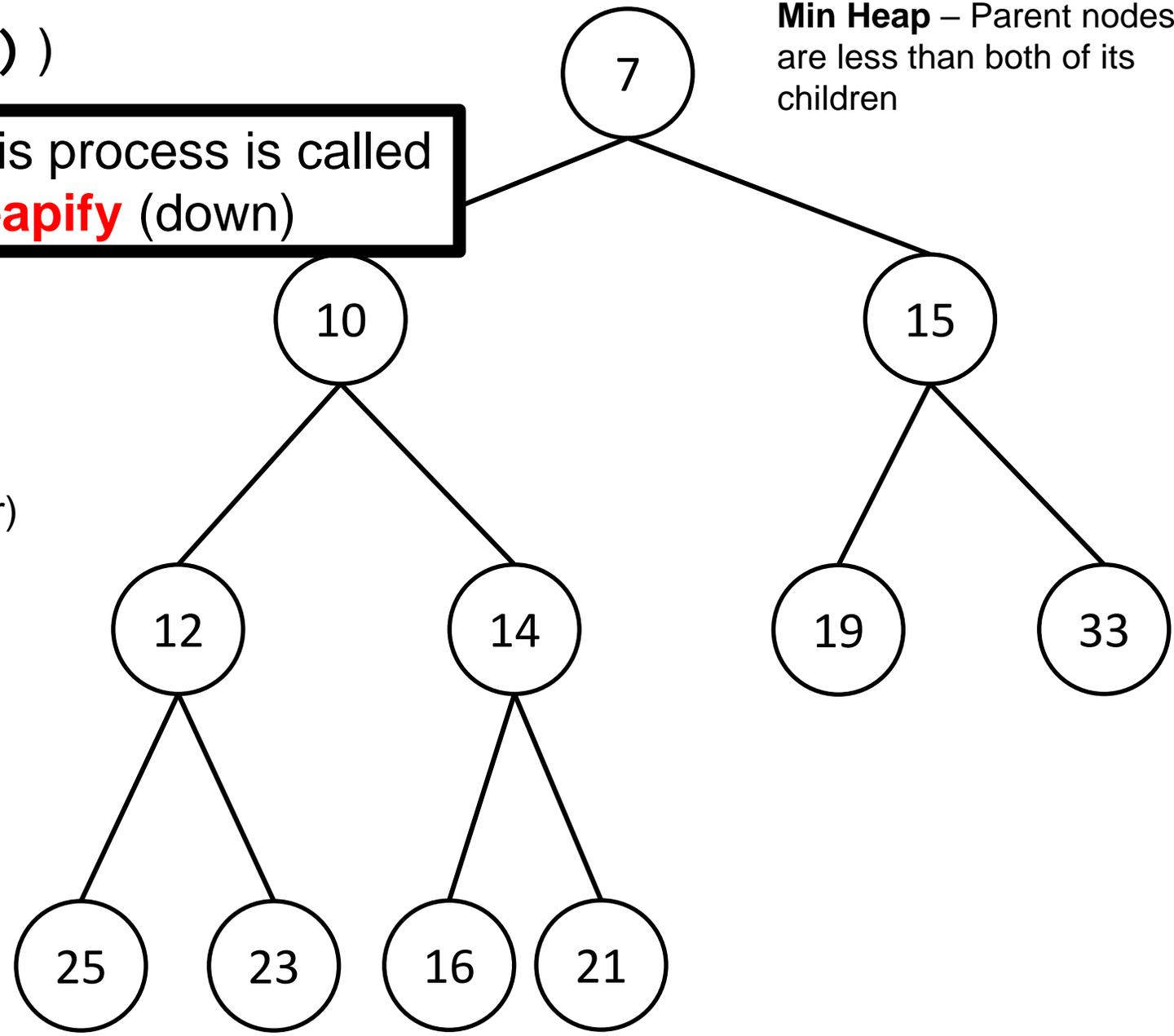
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Running time?

- Removing root: **$O(1)$**
- Replacing root: **$O(1)$** (this will make sense later)
- Heapify down: **$O(\log n)$**

Total running time: **$O(\log n)$**

Heap Operations – Removal (`poll()`)

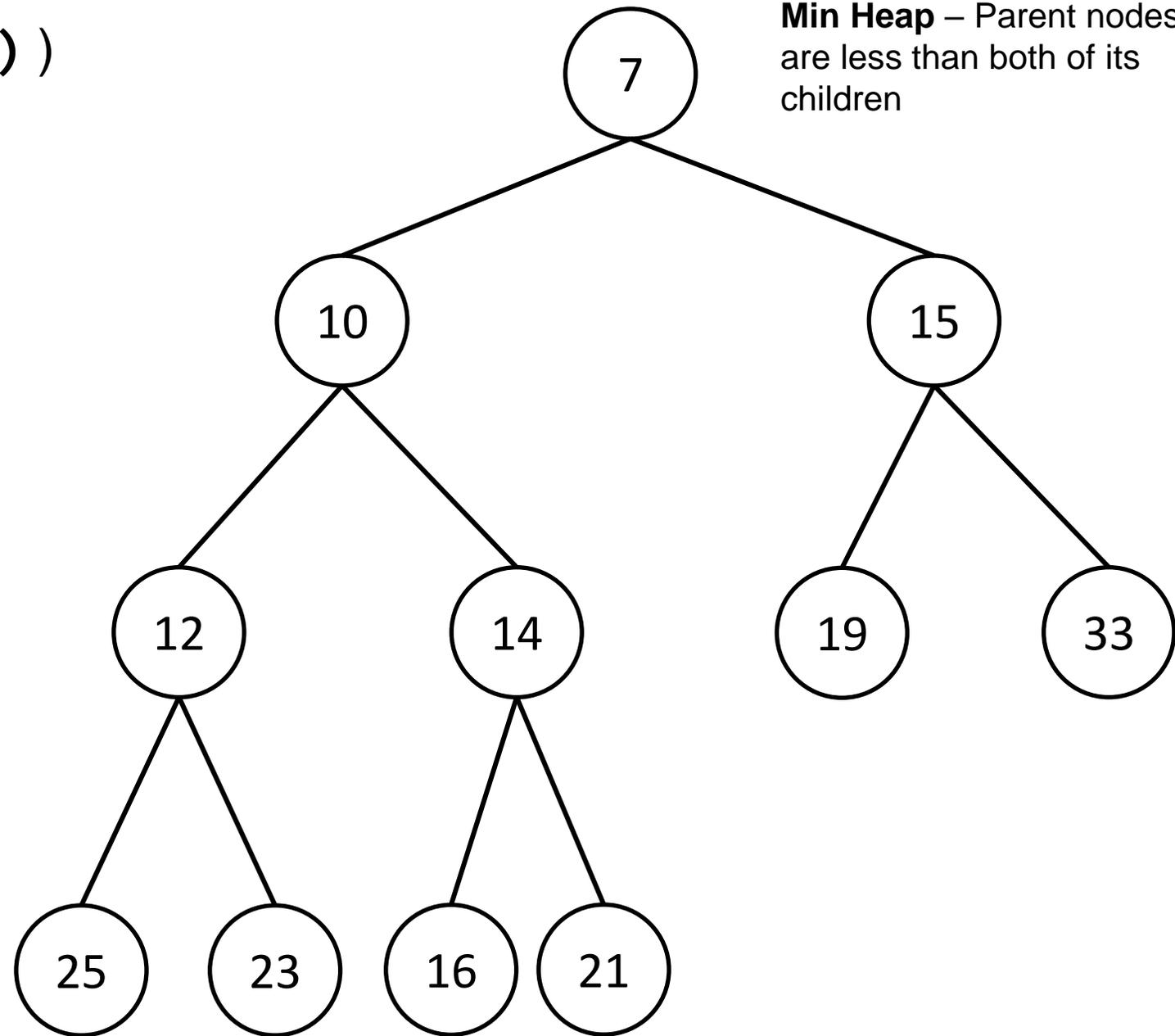
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Heapify (up)

Moving the new leaf node **up** in the tree

Heapify (down)

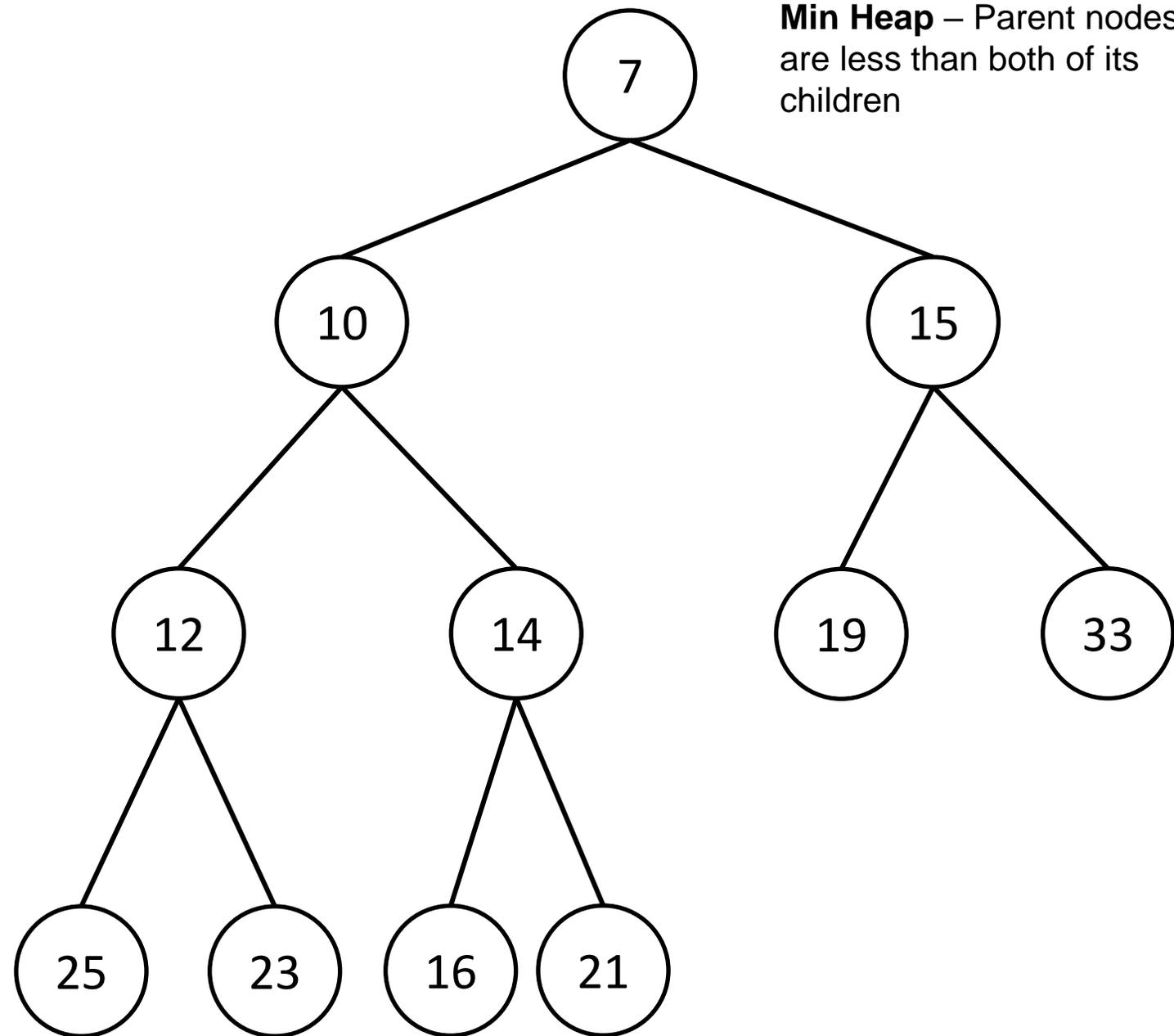
Moving the new root node **down** in the tree



Heap Representation

How to represent a heap?

```
public class HeapNode{  
    Node leftChild;  
    Node rightChild;  
    Node parent;  
    (...)  
}
```

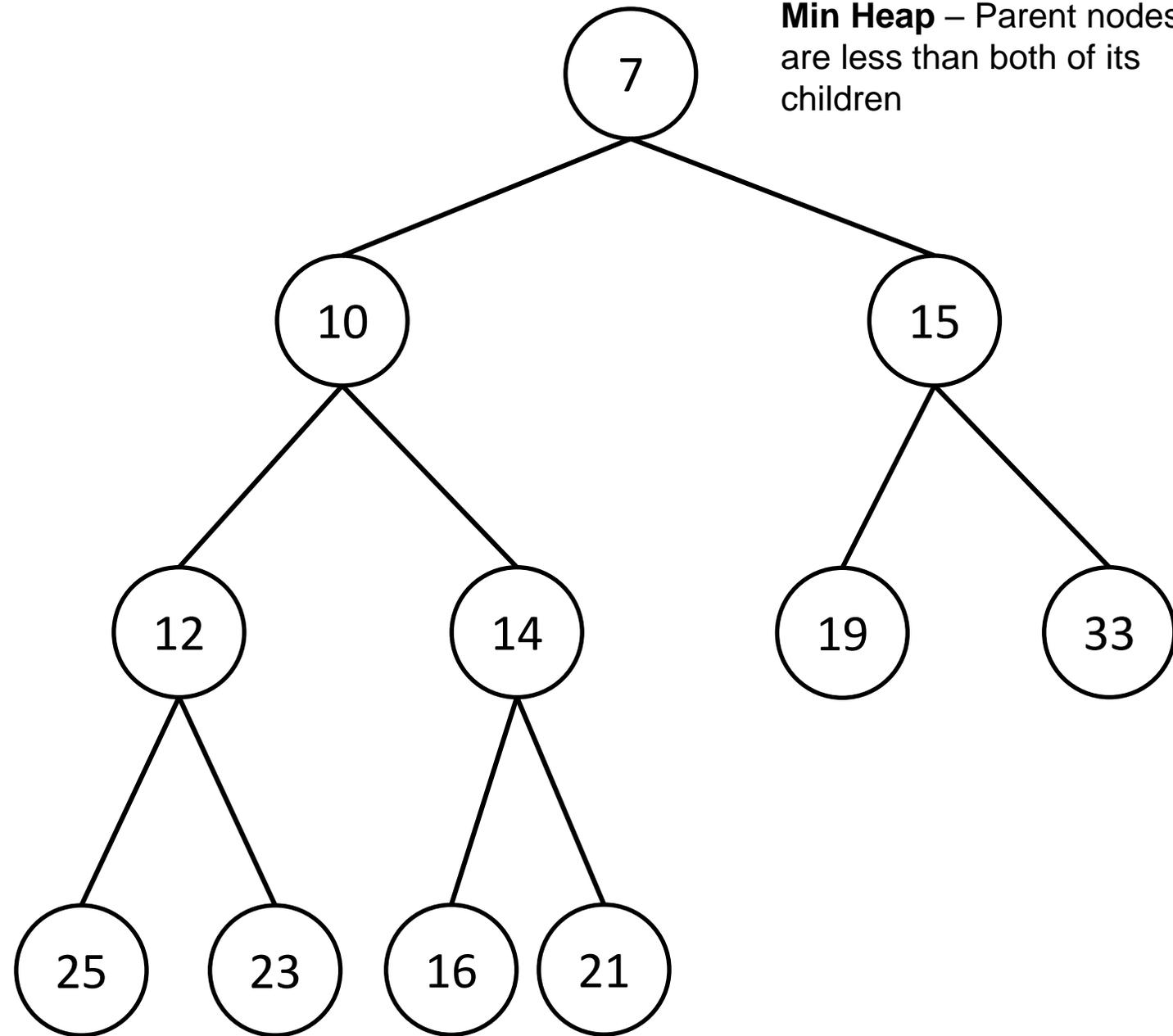


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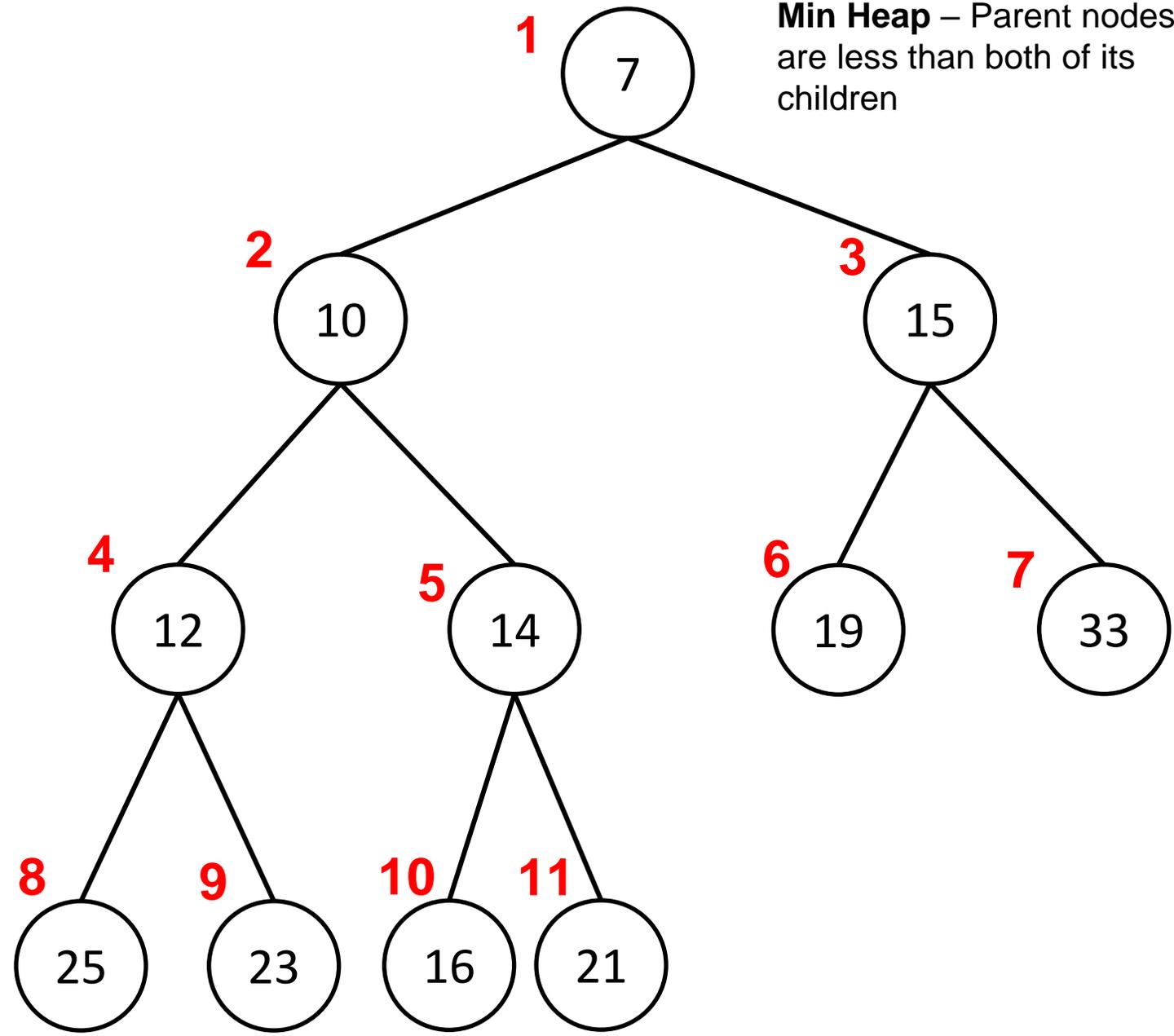
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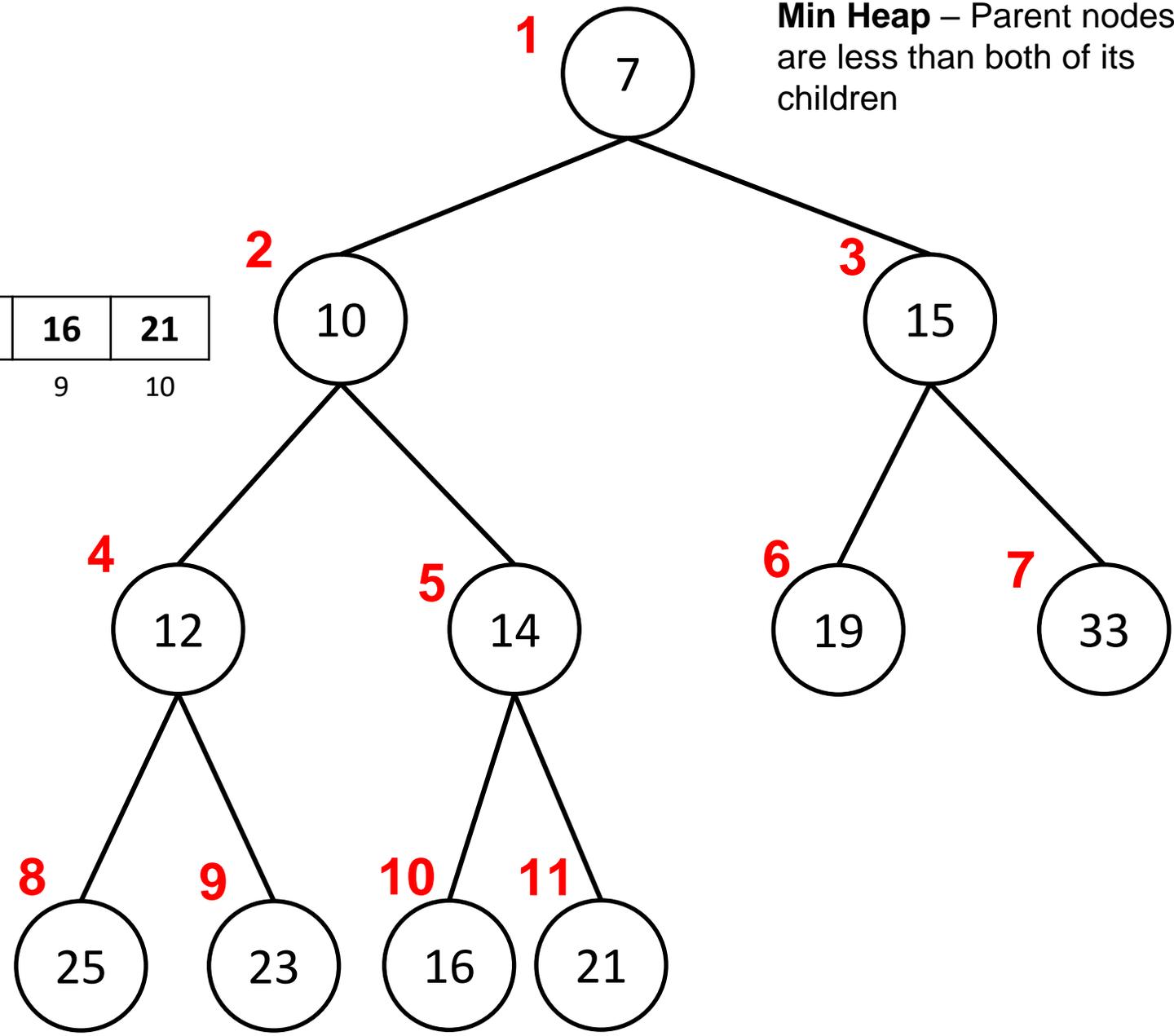


Heap Representation

Min Heap – Parent nodes are less than both of its children

Array

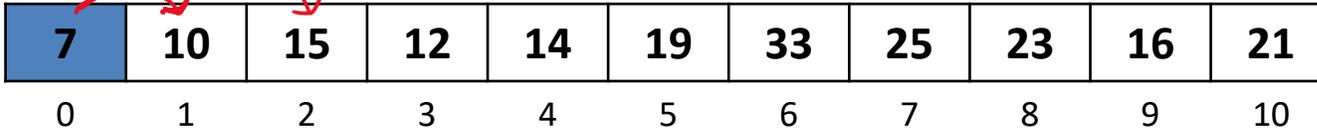
7	10	15	12	14	19	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



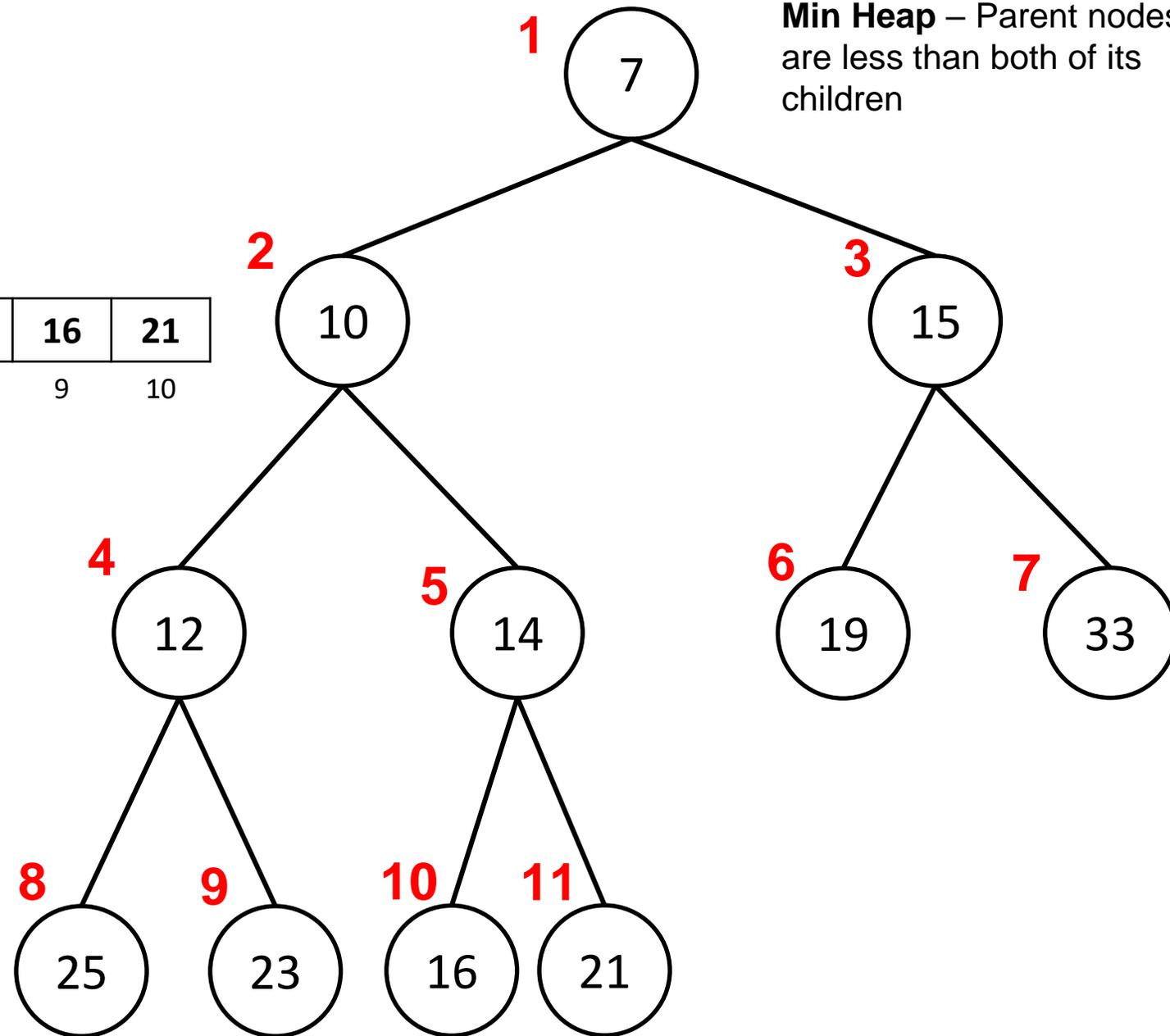
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Given a spot in the array, how can we find its children?

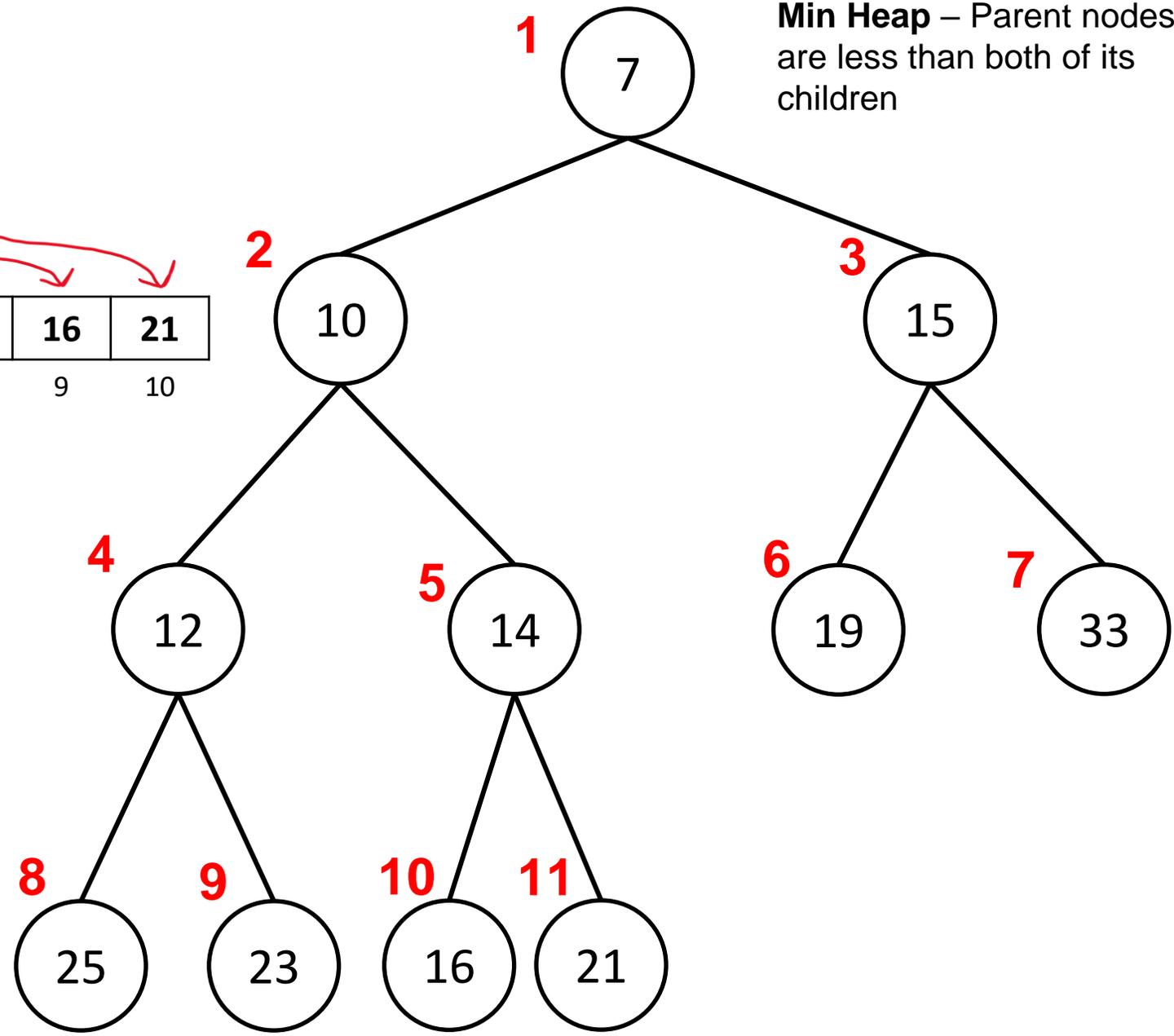


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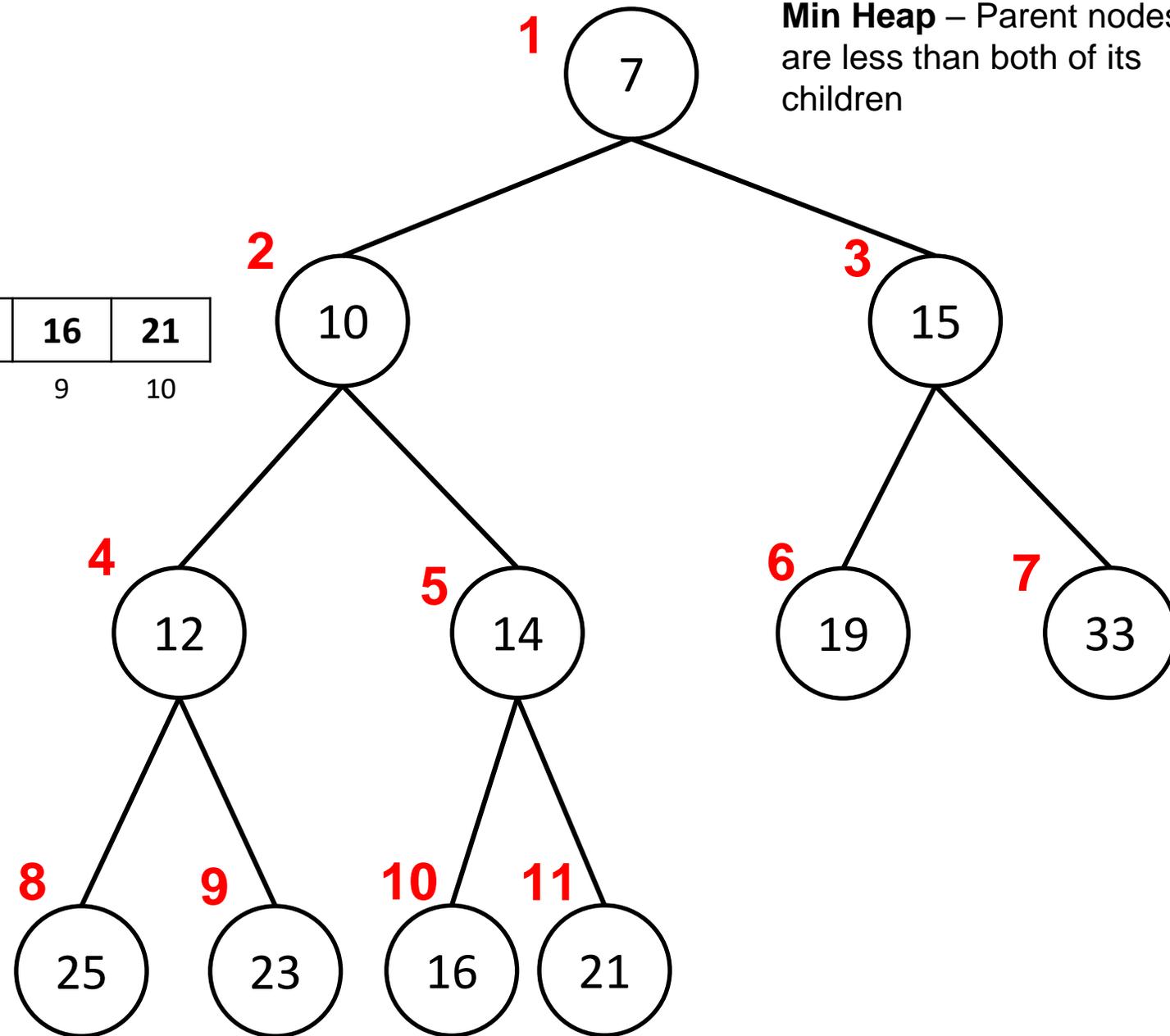
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Because this is a complete binary tree, there is a pretty nifty formula for this

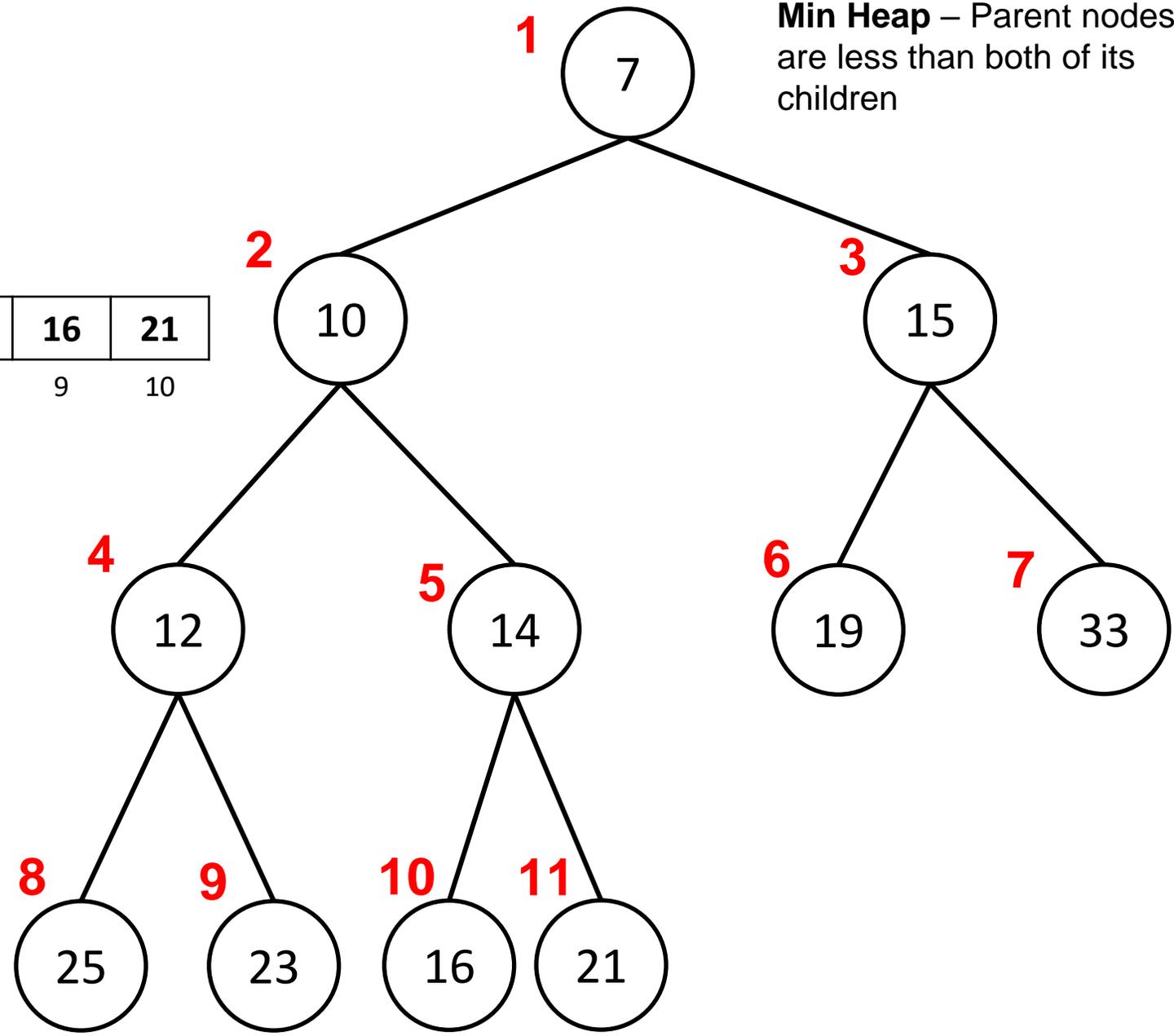


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For a given element at index i

Its left child will be located at index:

$$2 * i + 1$$

Its right child will be located at index:

$$2 * i + 2$$

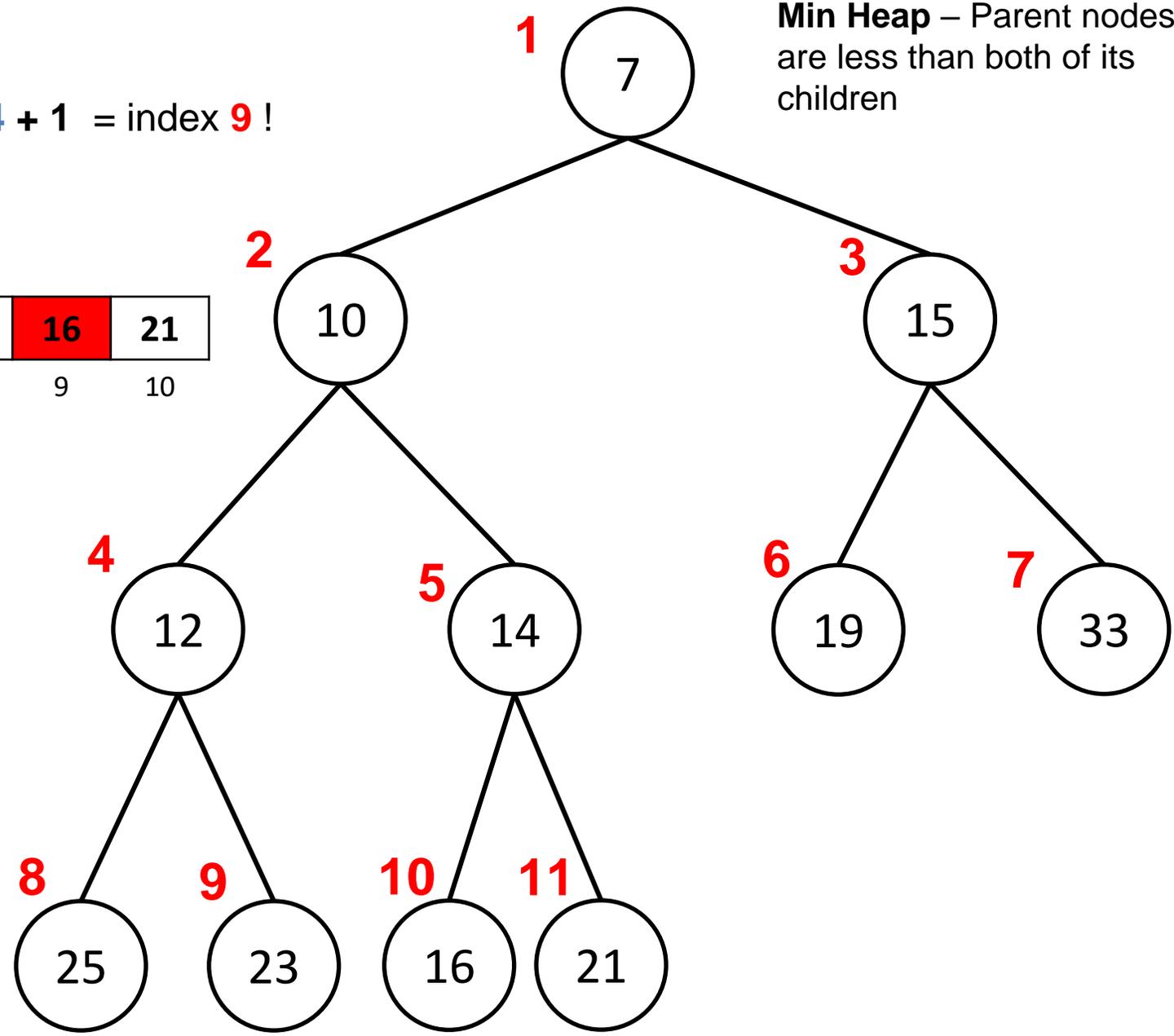
Heap Representation

Min Heap – Parent nodes are less than both of its children

$$\text{Left Child} = 2 * 4 + 1 = \text{index } 9 !$$

Array

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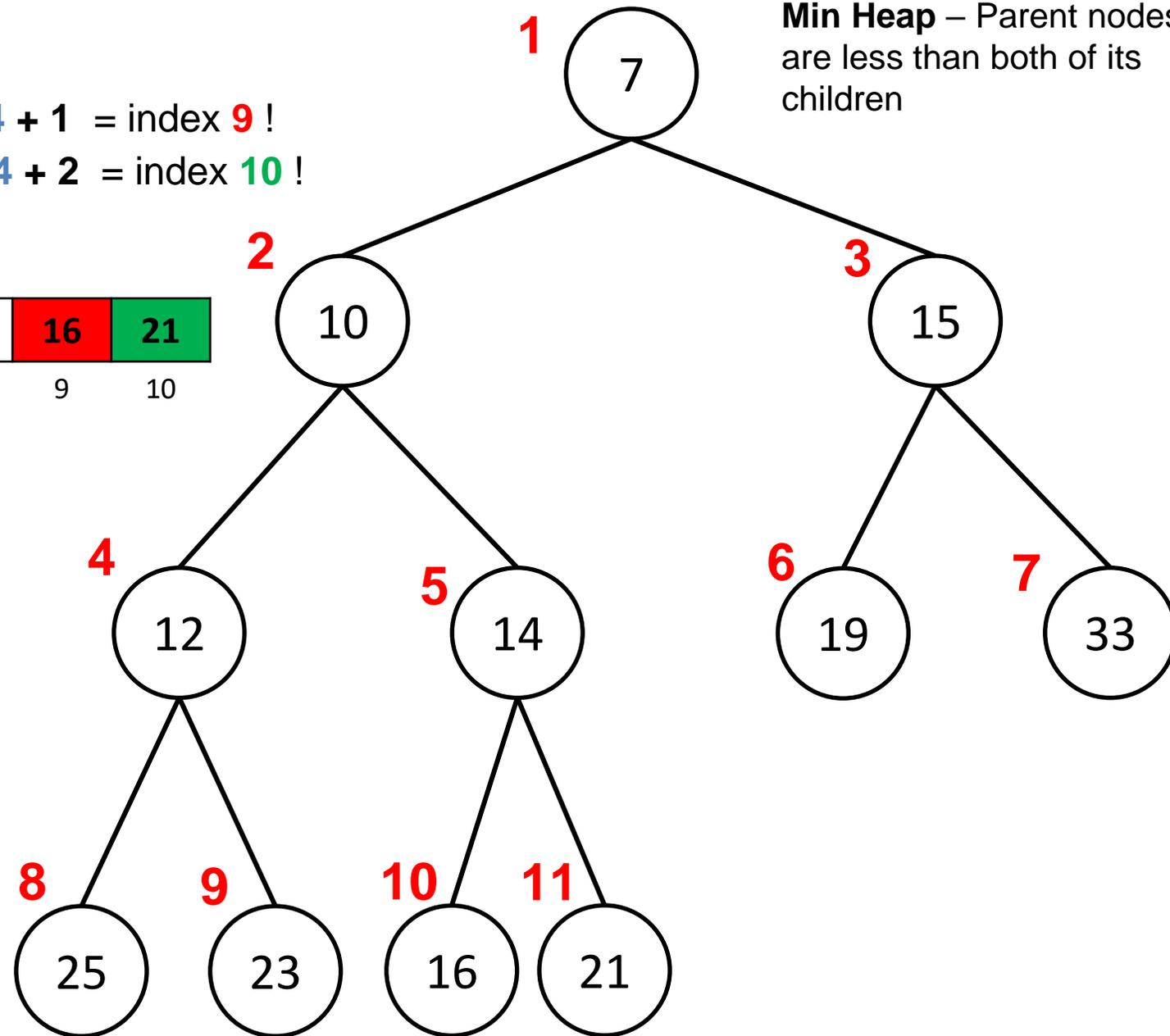
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Left Child = $2 * 4 + 1 = \text{index } 9!$
Right Child = $2 * 4 + 2 = \text{index } 10!$

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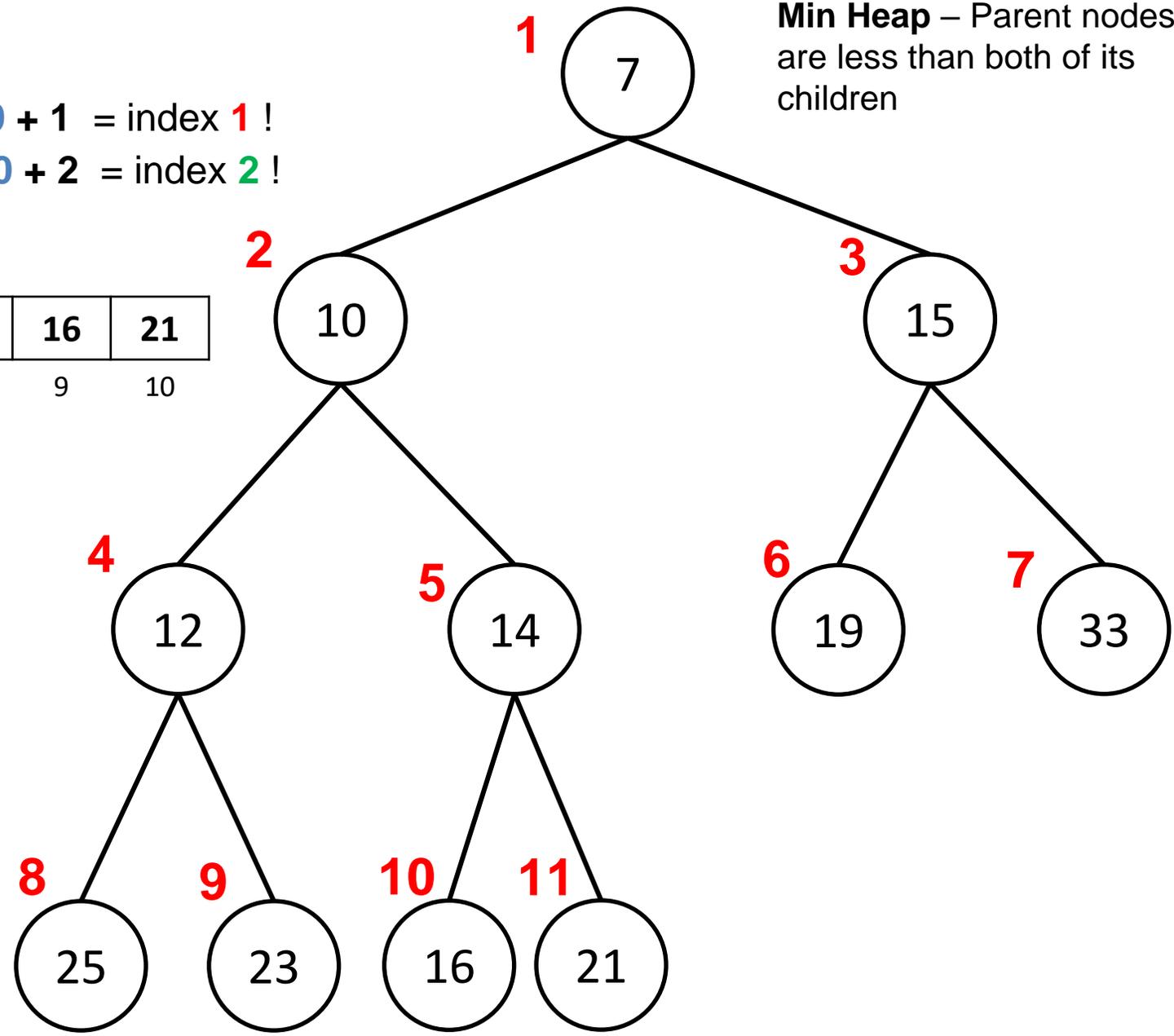
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$$\text{Left Child} = 2 * 0 + 1 = \text{index } 1!$$
$$\text{Right Child} = 2 * 0 + 2 = \text{index } 2!$$

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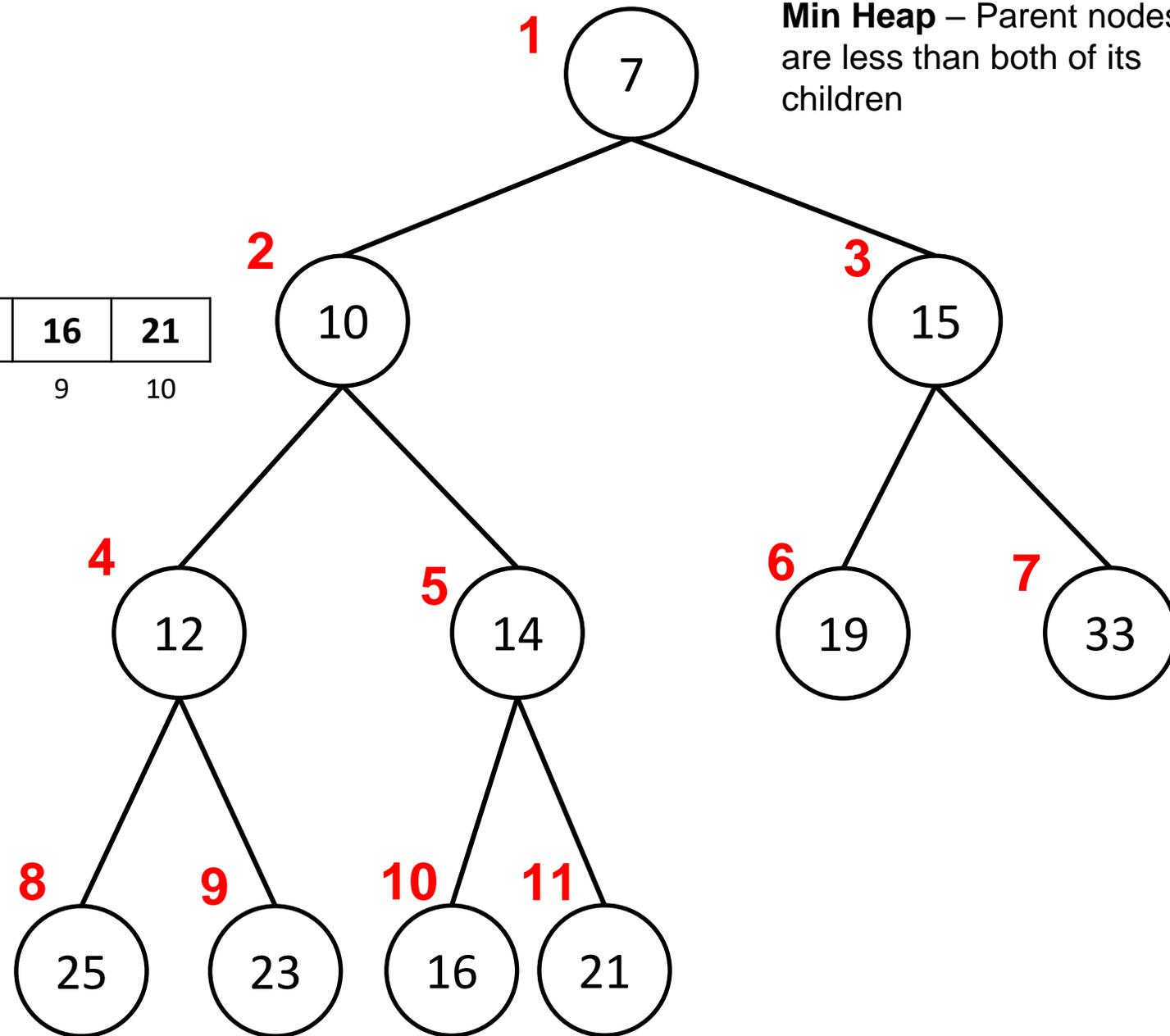
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Given a spot in the array, how can we find its parent?

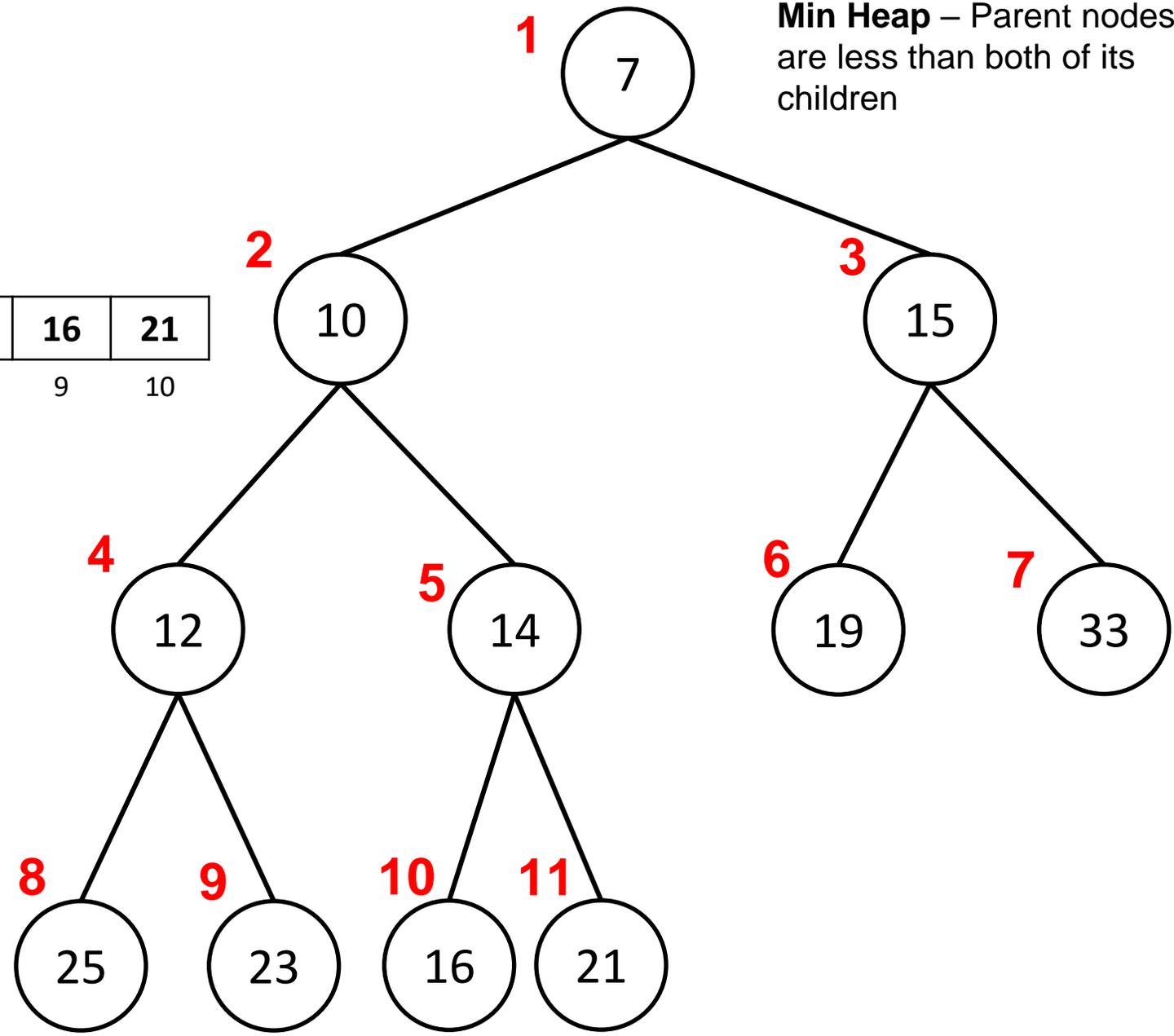


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Given a spot in the array, how can we find its parent?

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Given an index i

Its parent will be located at index:

$$(i - 1) / 2$$

(remember that the / operator will **floor** the answer)

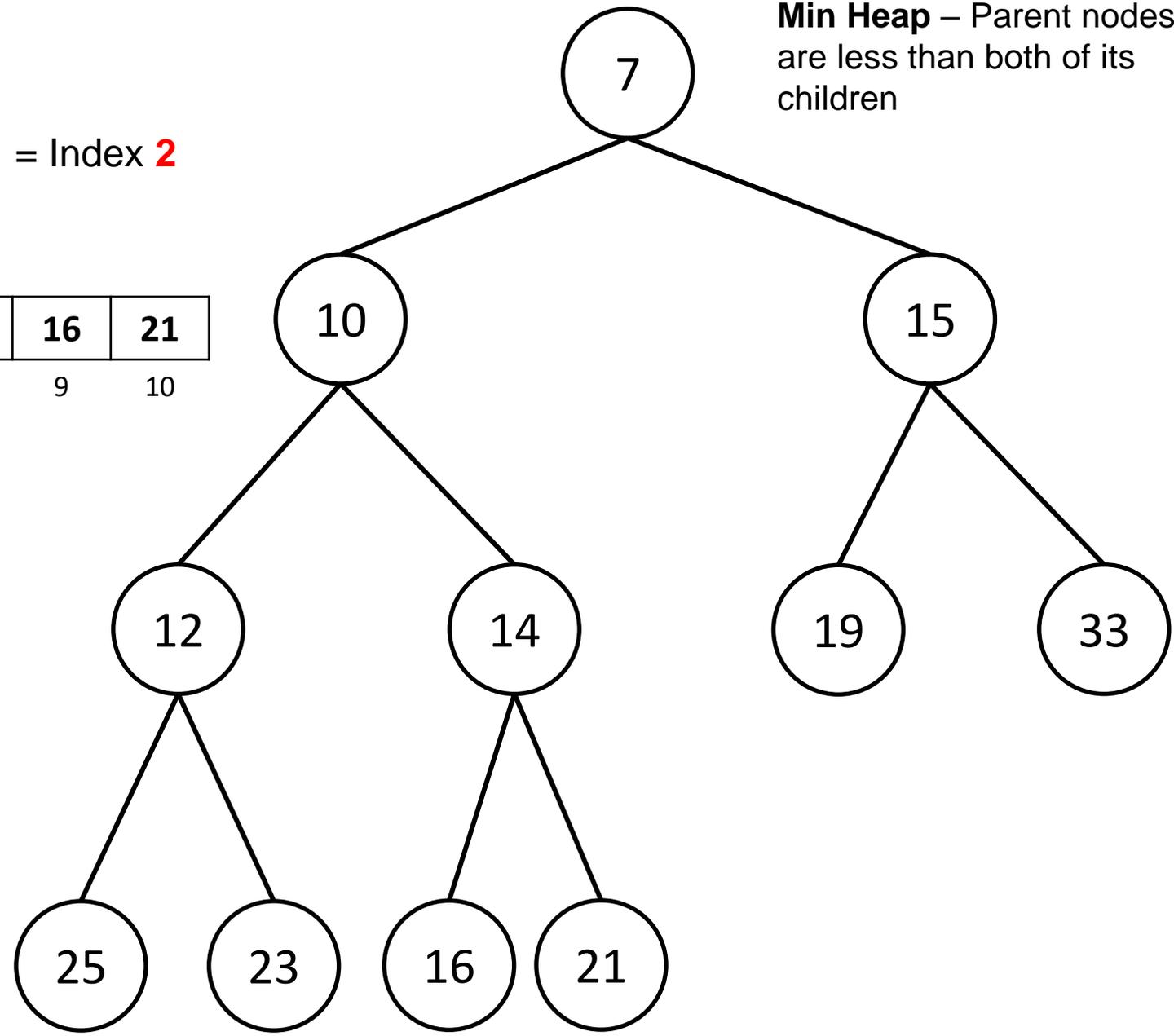
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$$\text{Parent} = (6 - 1) / 2 = \text{Index } 2$$

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Given an index i

Its parent will be located at index:

$$(i - 1) / 2$$

(remember that the / operator will **floor** the answer)

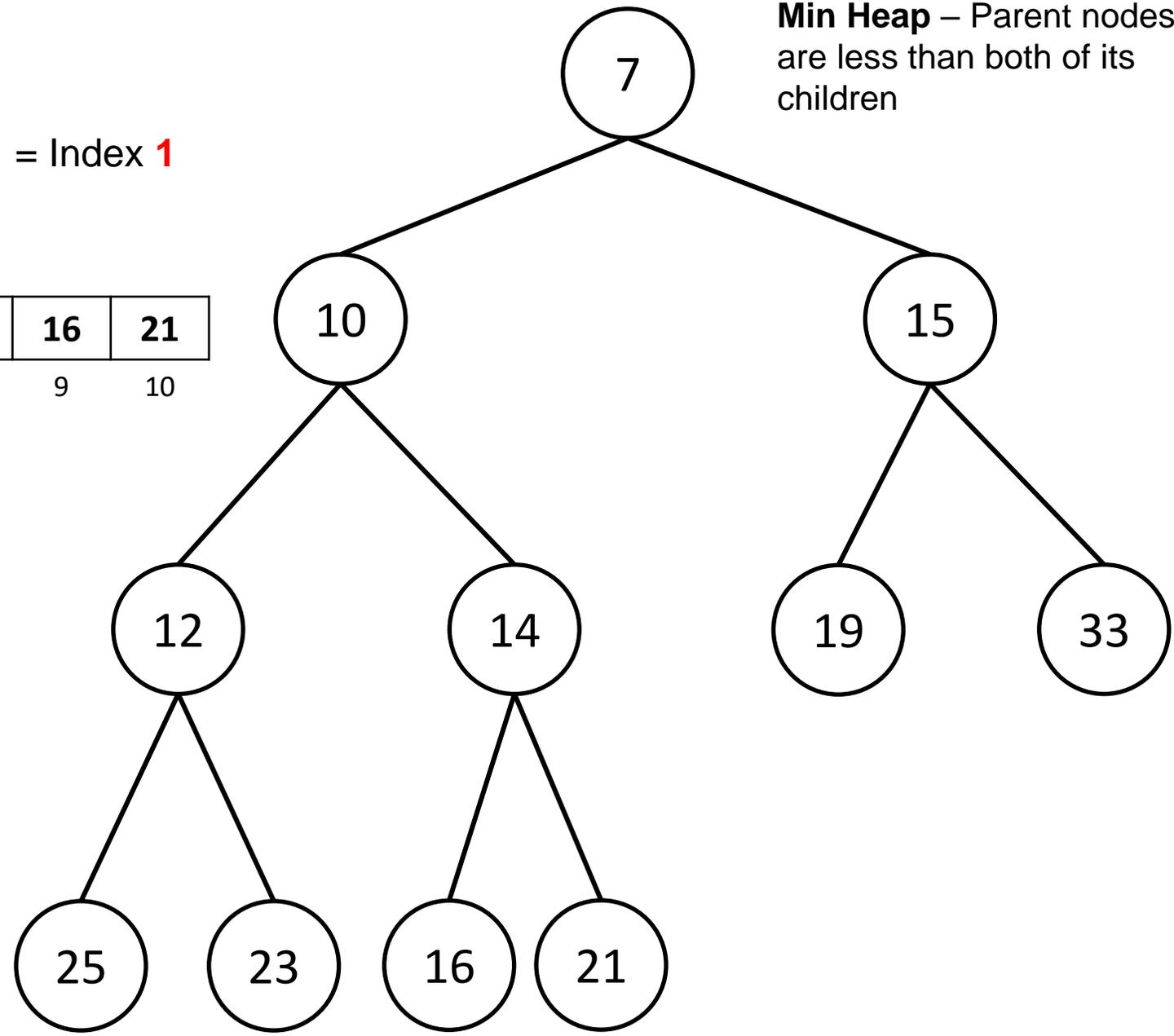
Heap Representation

Min Heap – Parent nodes are less than both of its children

$$\text{Parent} = (3 - 1) / 2 = \text{Index } 1$$

Array

7	10	15	12	14	19	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



Given a spot in the array, how can we find its parent?

Because this is a complete binary tree, there is a pretty nifty formula for this

Given an index i

Its parent will be located at index:

$$(i - 1) / 2$$

(remember that the / operator will **floor** the answer)

Heap Representation

Min Heap – Parent nodes are less than both of its children

Array

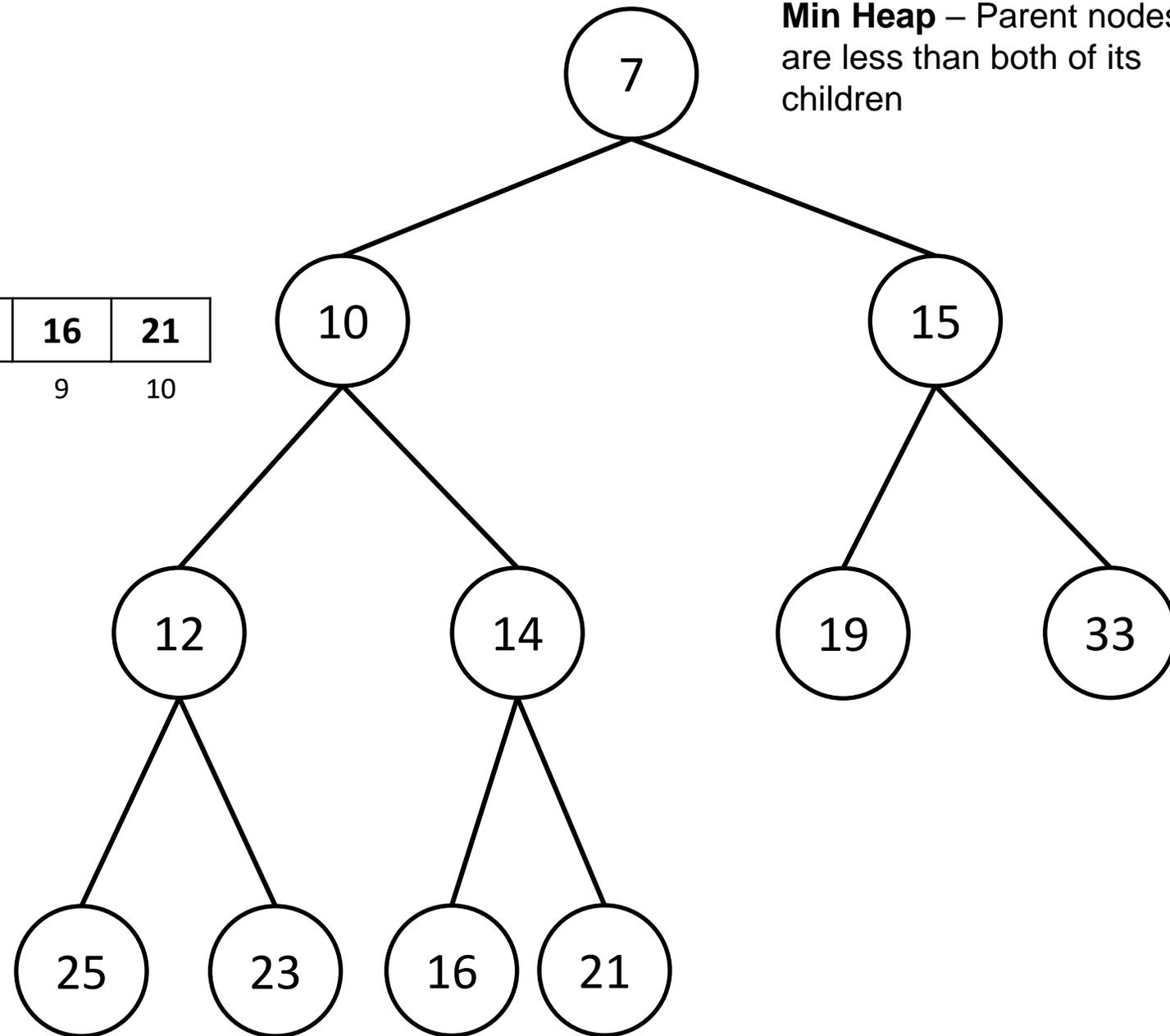
7	10	15	12	14	19	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

We can represent our tree with an array!
We have formulas to find the left child, right child, and parent for a given node

Left Child $2 * i + 1$

Right Child $2 * i + 2$

Parent $(i - 1) / 2$



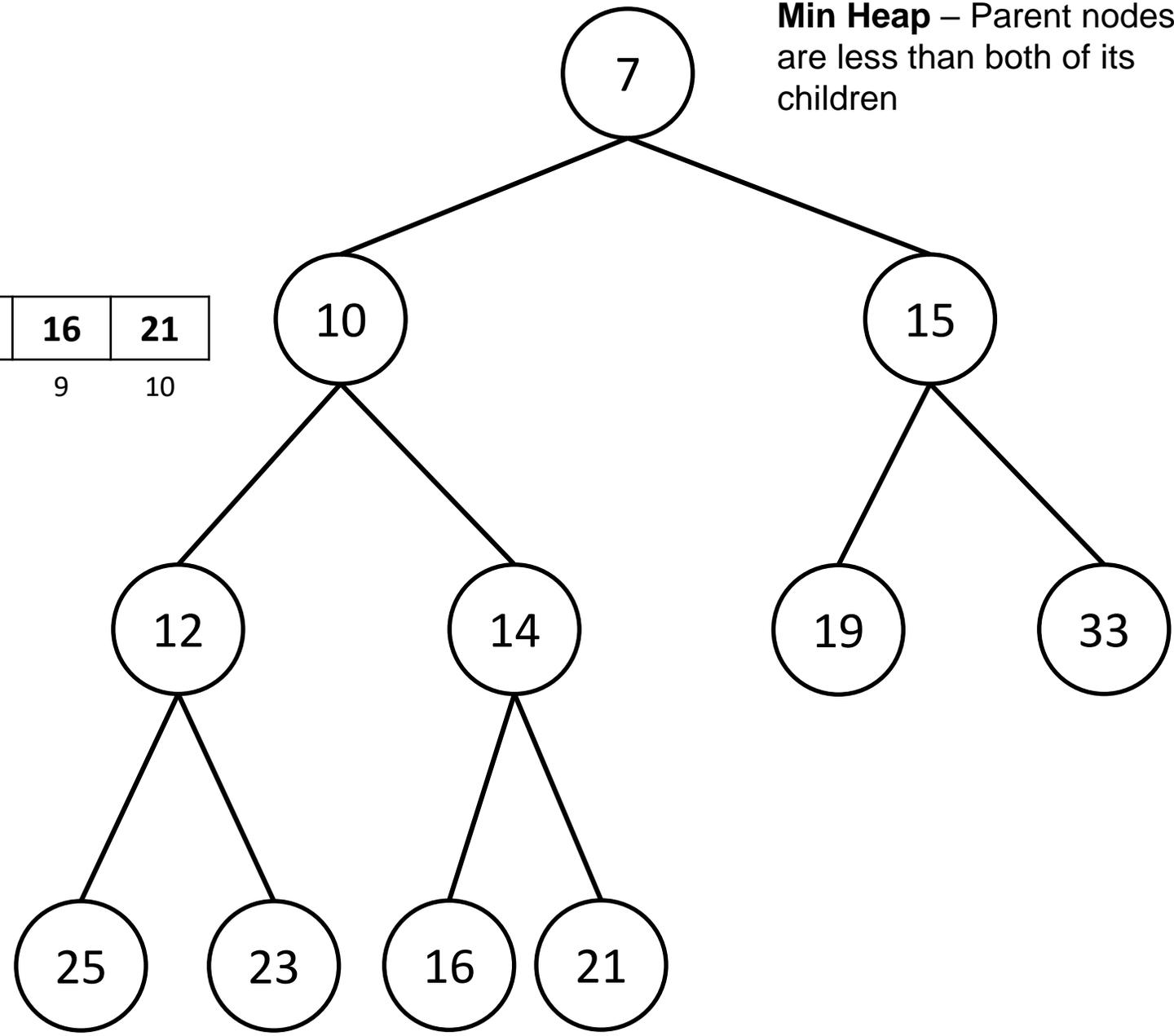
Heap Representation

Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	19	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`insert(11);`



Heap Representation

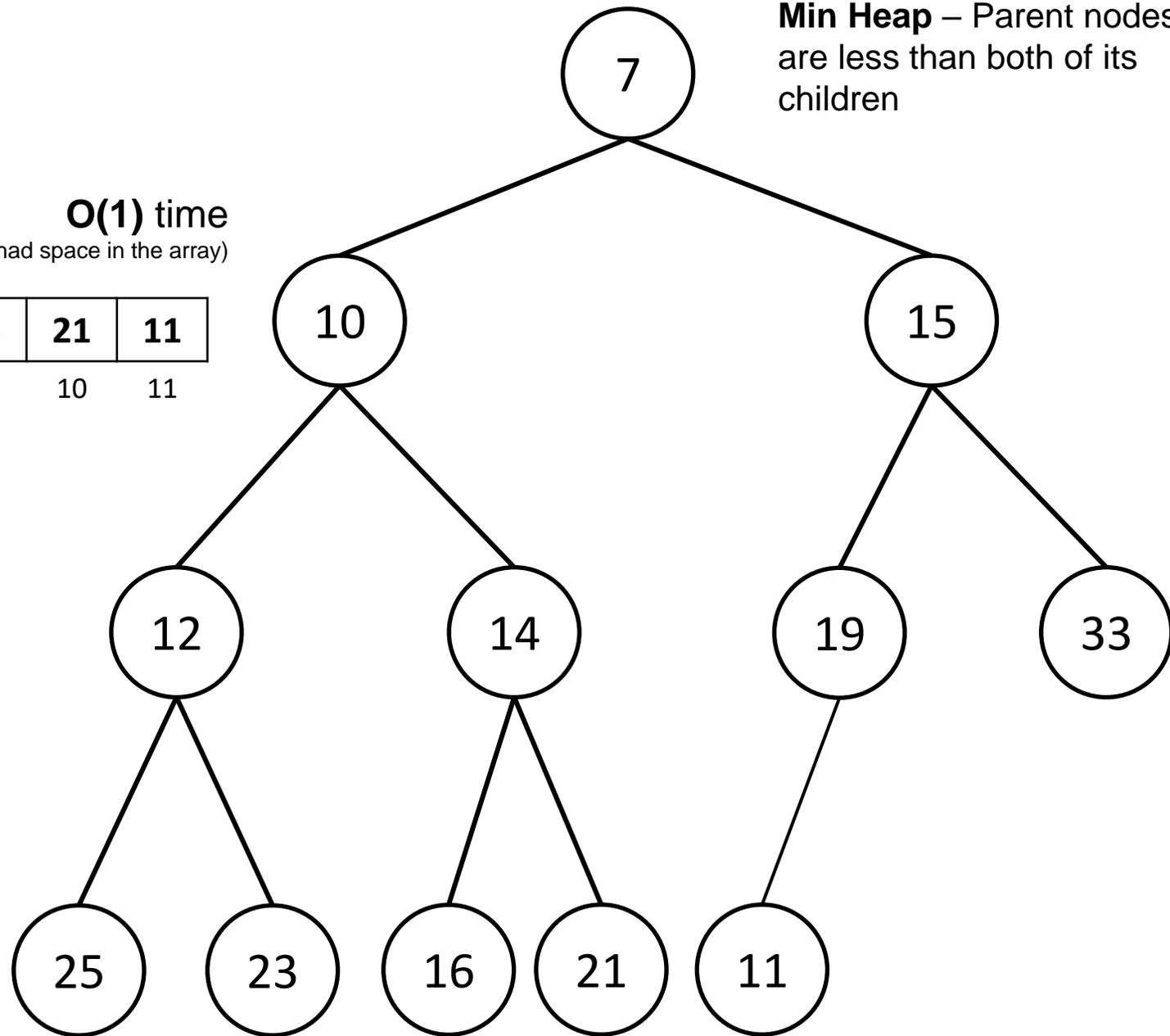
Min Heap – Parent nodes are less than both of its children

Array

O(1) time
(assuming we had space in the array)

7	10	15	12	14	19	33	25	23	16	21	11
0	1	2	3	4	5	6	7	8	9	10	11

`insert(11);`



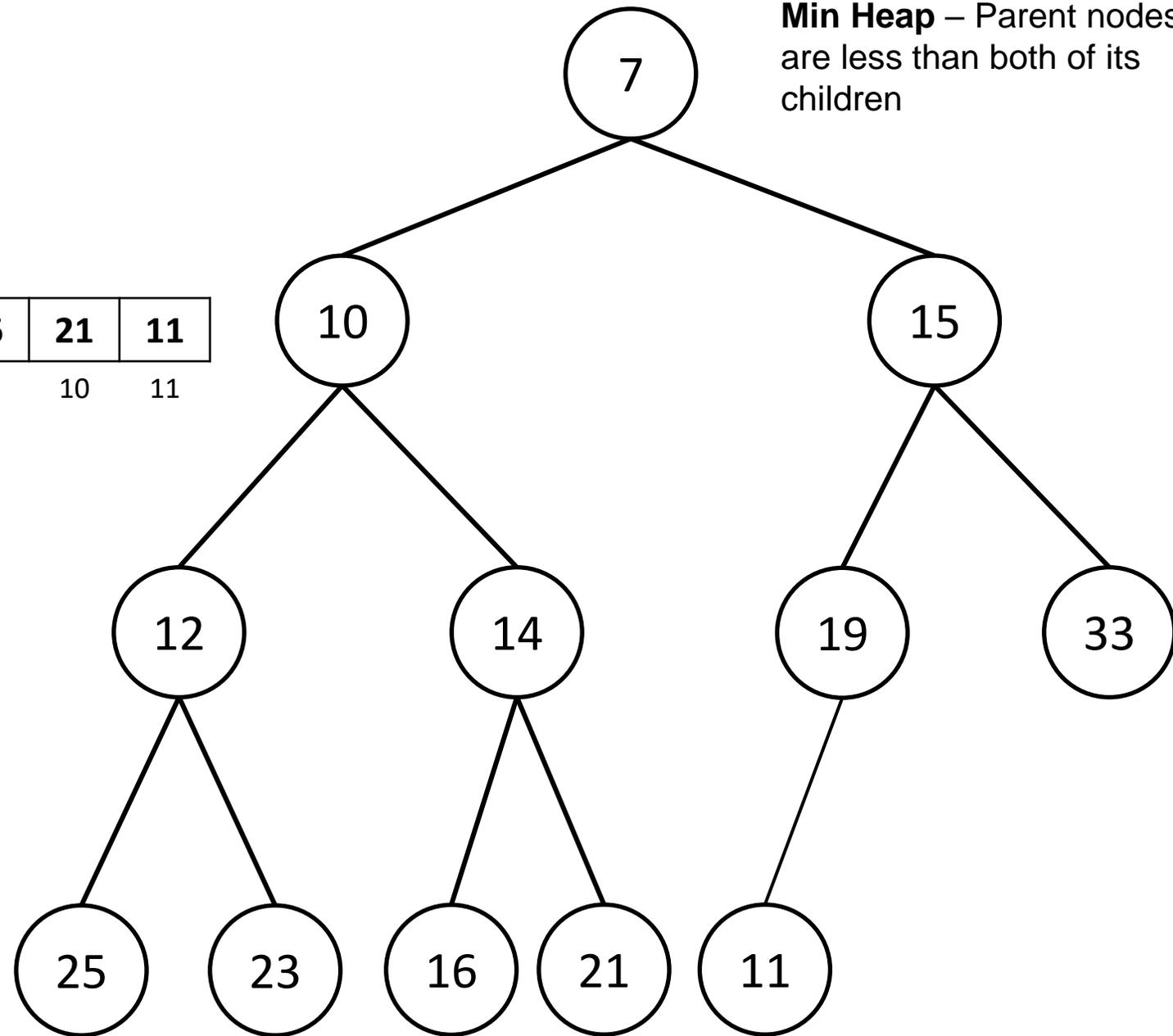
Heap Representation

Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	19	33	25	23	16	21	11
0	1	2	3	4	5	6	7	8	9	10	11

`insert(11);`
Time to Heapify Up!



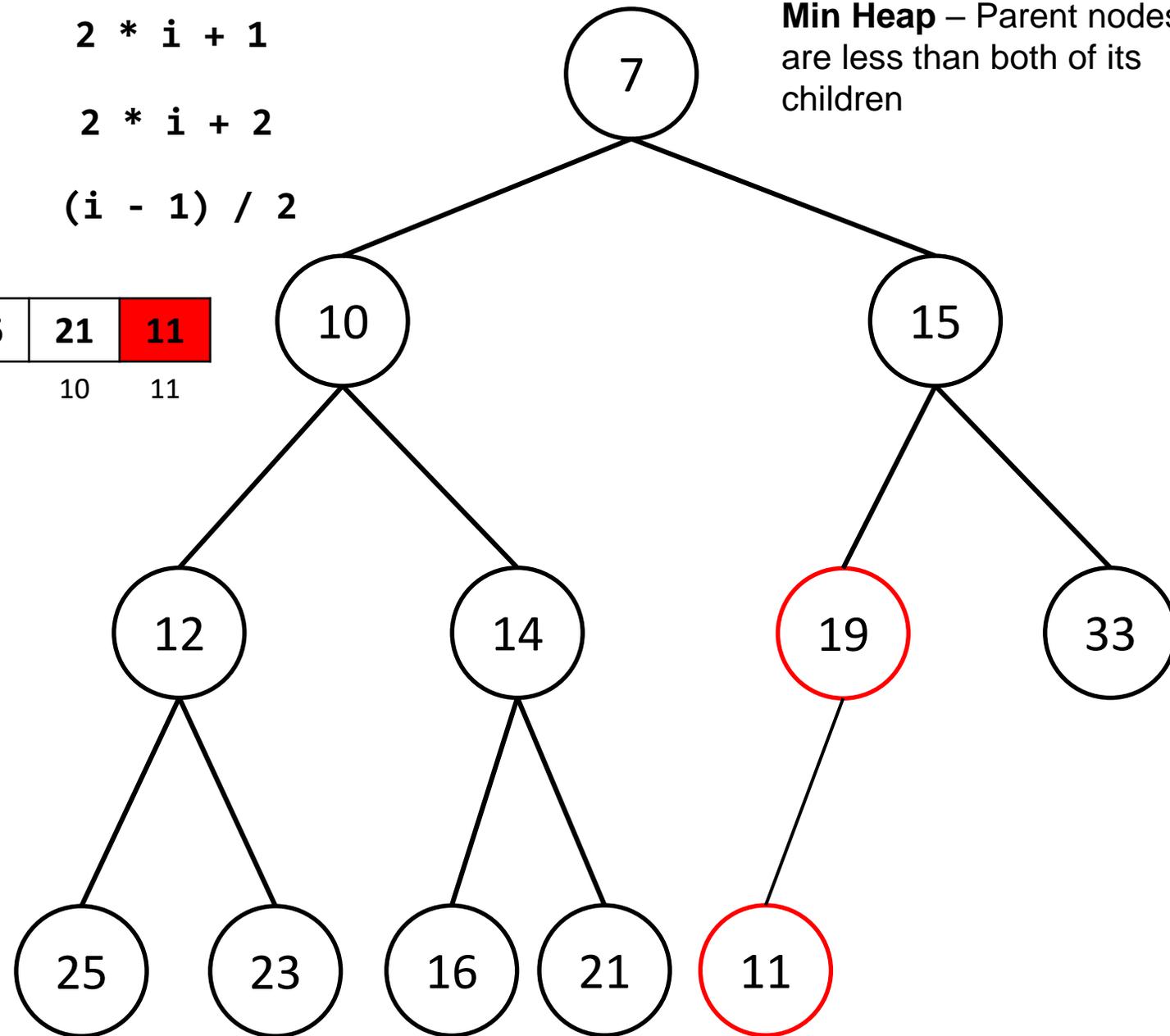
Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	19	33	25	23	16	21	11
0	1	2	3	4	5	6	7	8	9	10	11



`insert(11);`

Time to Heapify Up!

11's parent is located at $(11 - 1) / 2 = 5$

Heap Representation

Left Child $2 * i + 1$

Right Child $2 * i + 2$

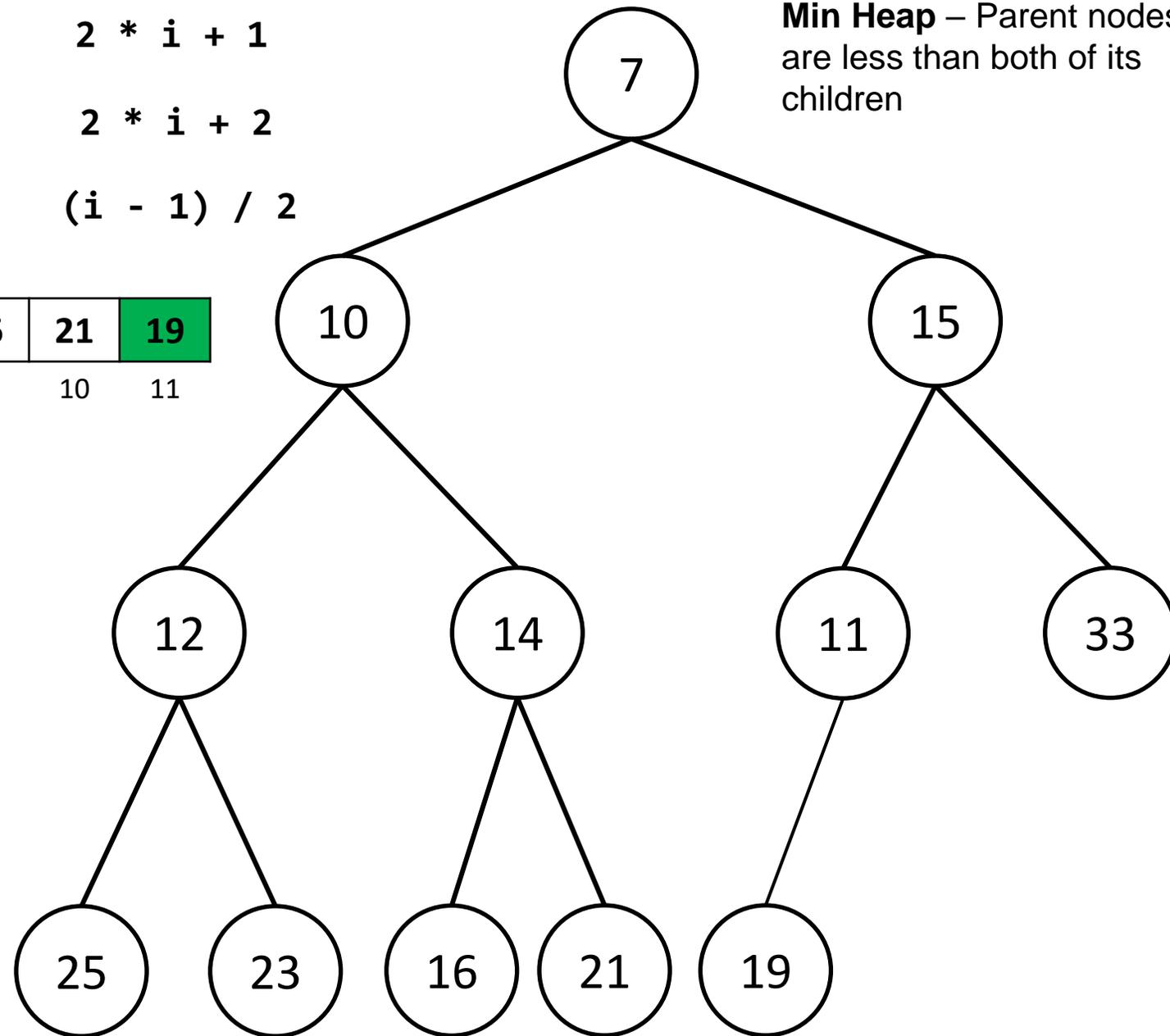
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	11	33	25	23	16	21	19
0	1	2	3	4	5	6	7	8	9	10	11

`insert(11);`
Time to Heapify Up!



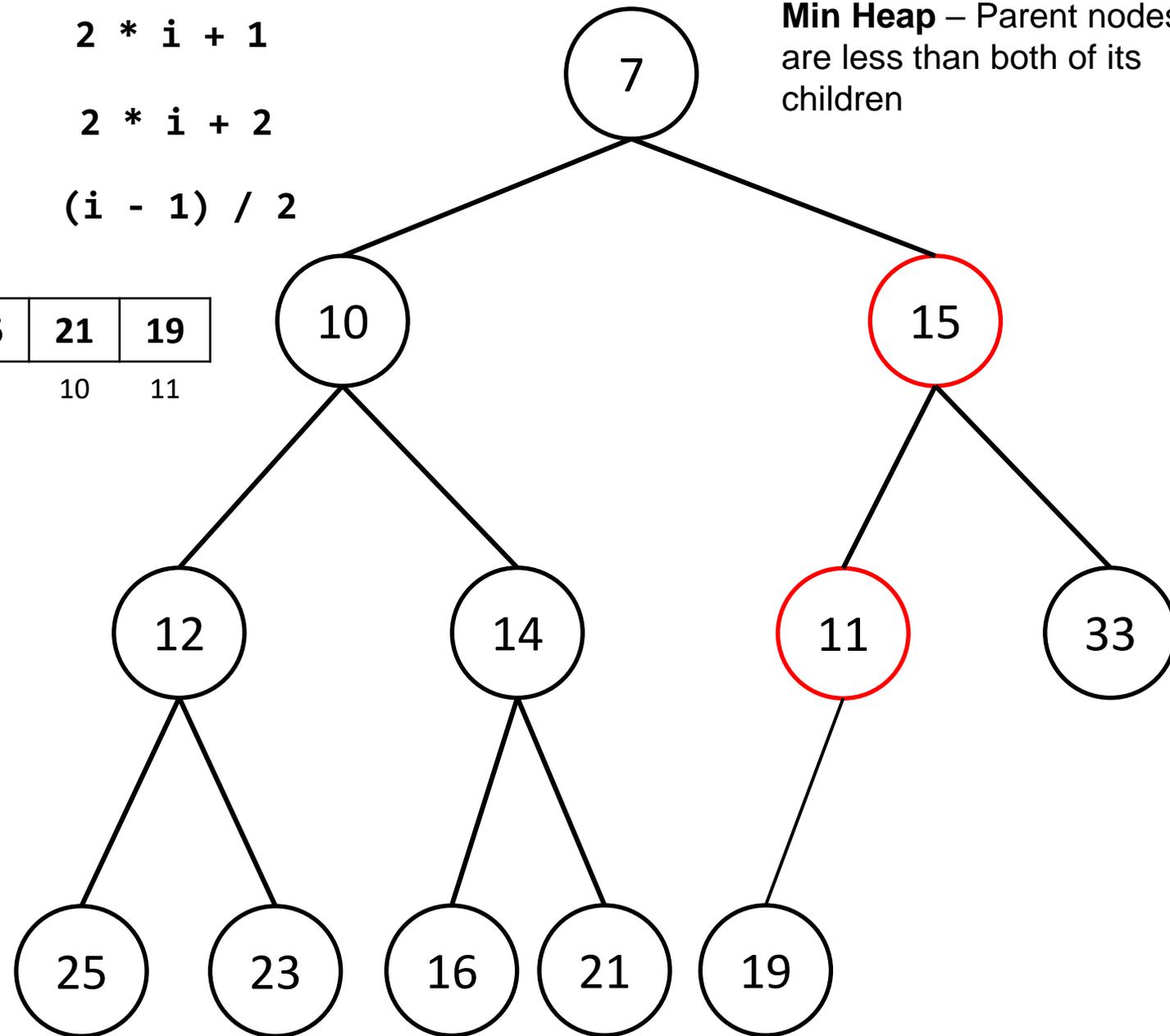
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Left Child $2 * i + 1$
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Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	11	33	25	23	16	21	19
0	1	2	3	4	5	6	7	8	9	10	11



`insert(11);`

Time to Heapify Up!

11's parent is located at $(5 - 1) / 2 = 2$

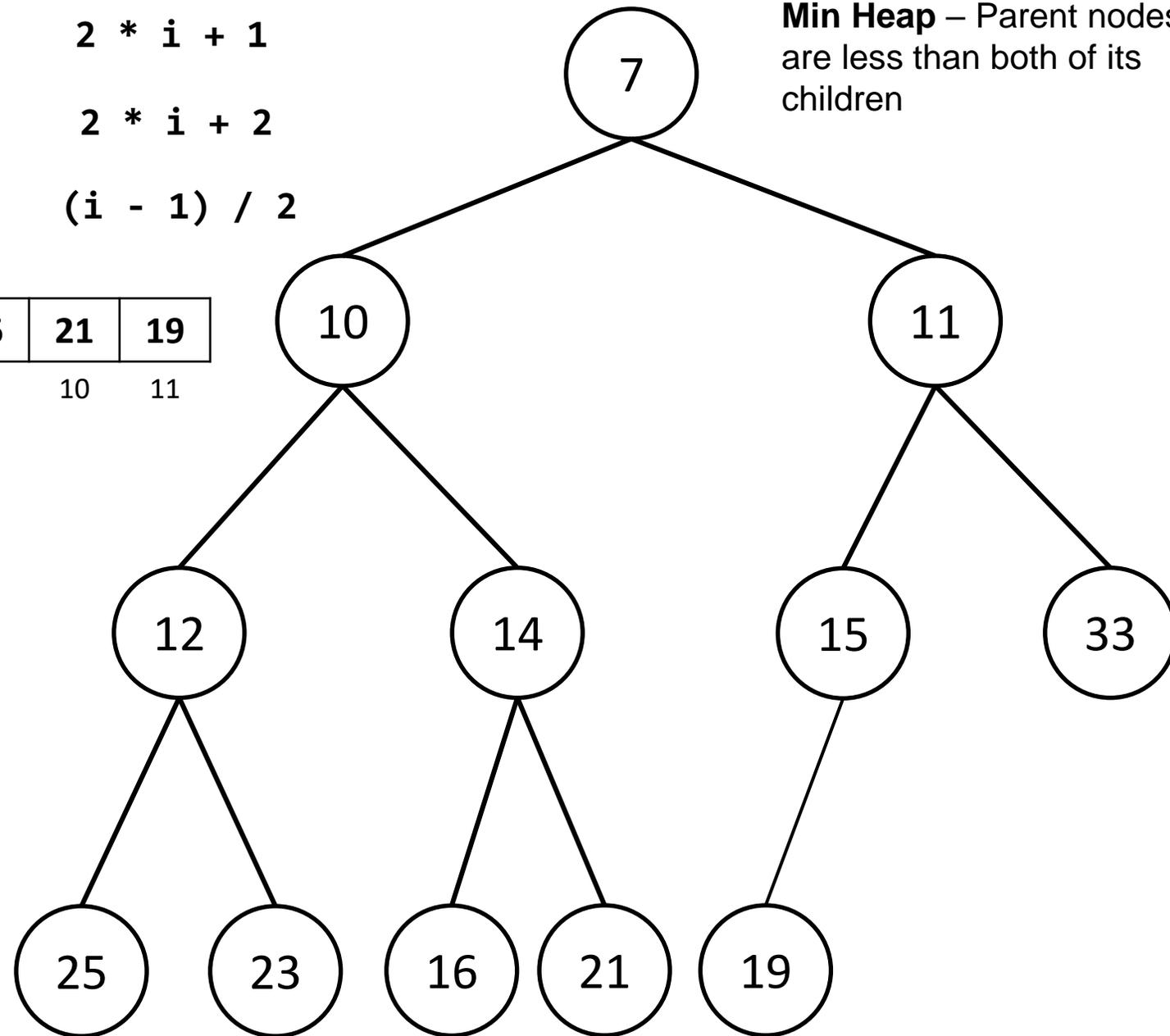
Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	11	12	14	15	33	25	23	16	21	19
0	1	2	3	4	5	6	7	8	9	10	11



`insert(11);`

Time to Heapify Up!

11's parent is located at $(5 - 1) / 2 = 2$

Heap Representation

Left Child $2 * i + 1$

Right Child $2 * i + 2$

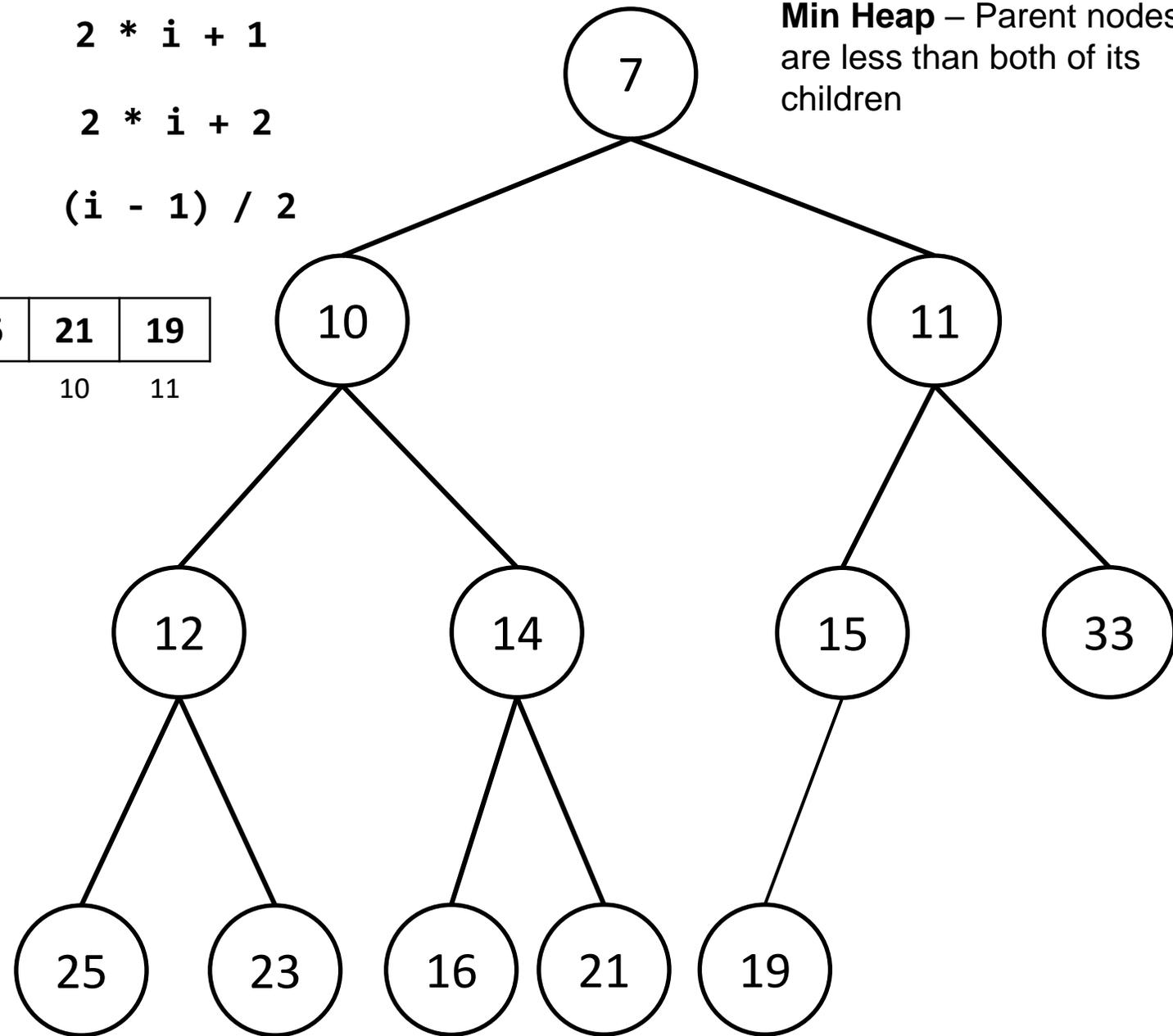
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	11	12	14	15	33	25	23	16	21	19
0	1	2	3	4	5	6	7	8	9	10	11

`insert(11);`
Time to Heapify Up!



Heap Representation

Left Child $2 * i + 1$

Right Child $2 * i + 2$

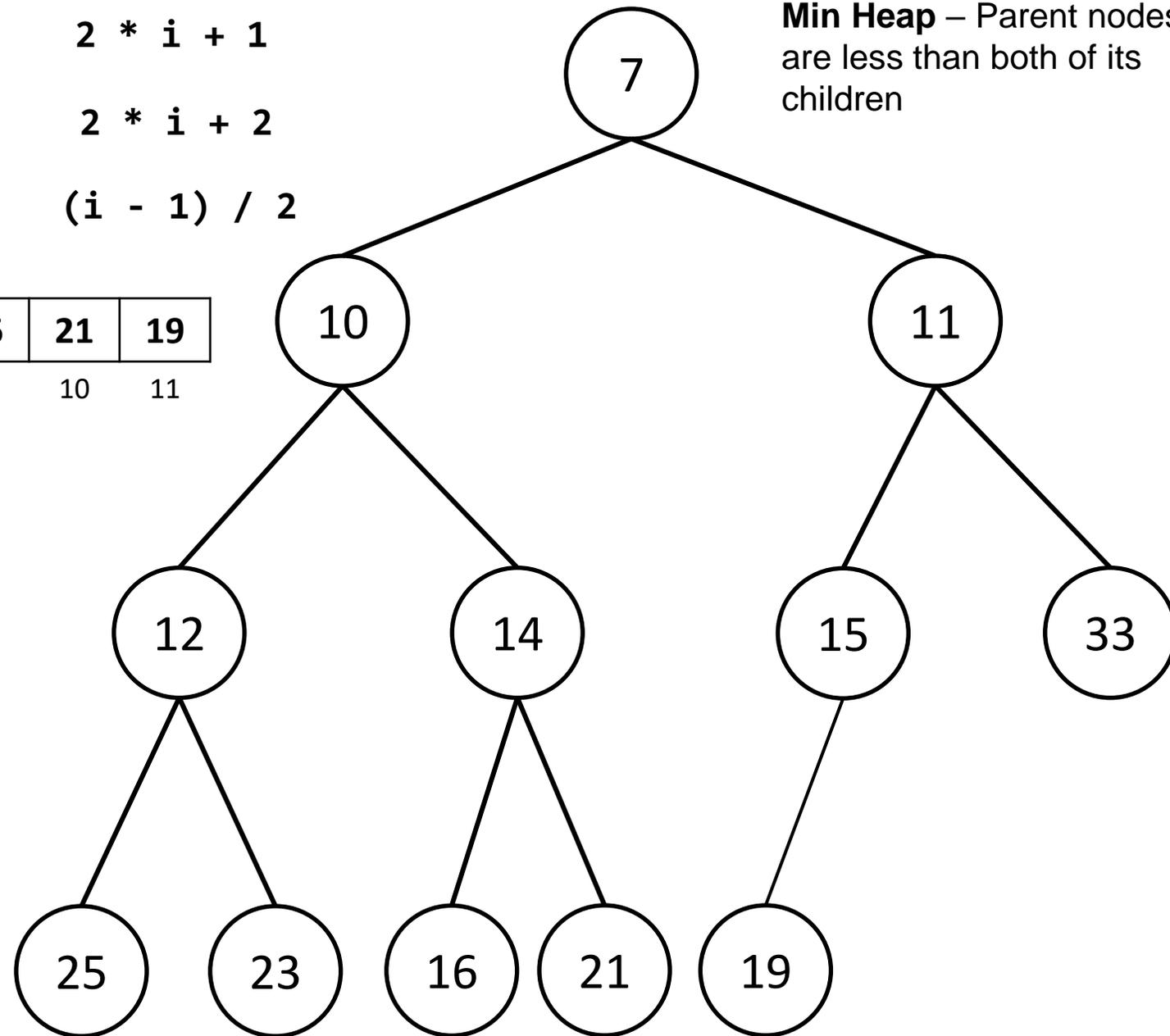
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

7	10	11	12	14	15	33	25	23	16	21	19
0	1	2	3	4	5	6	7	8	9	10	11

`poll();`



Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

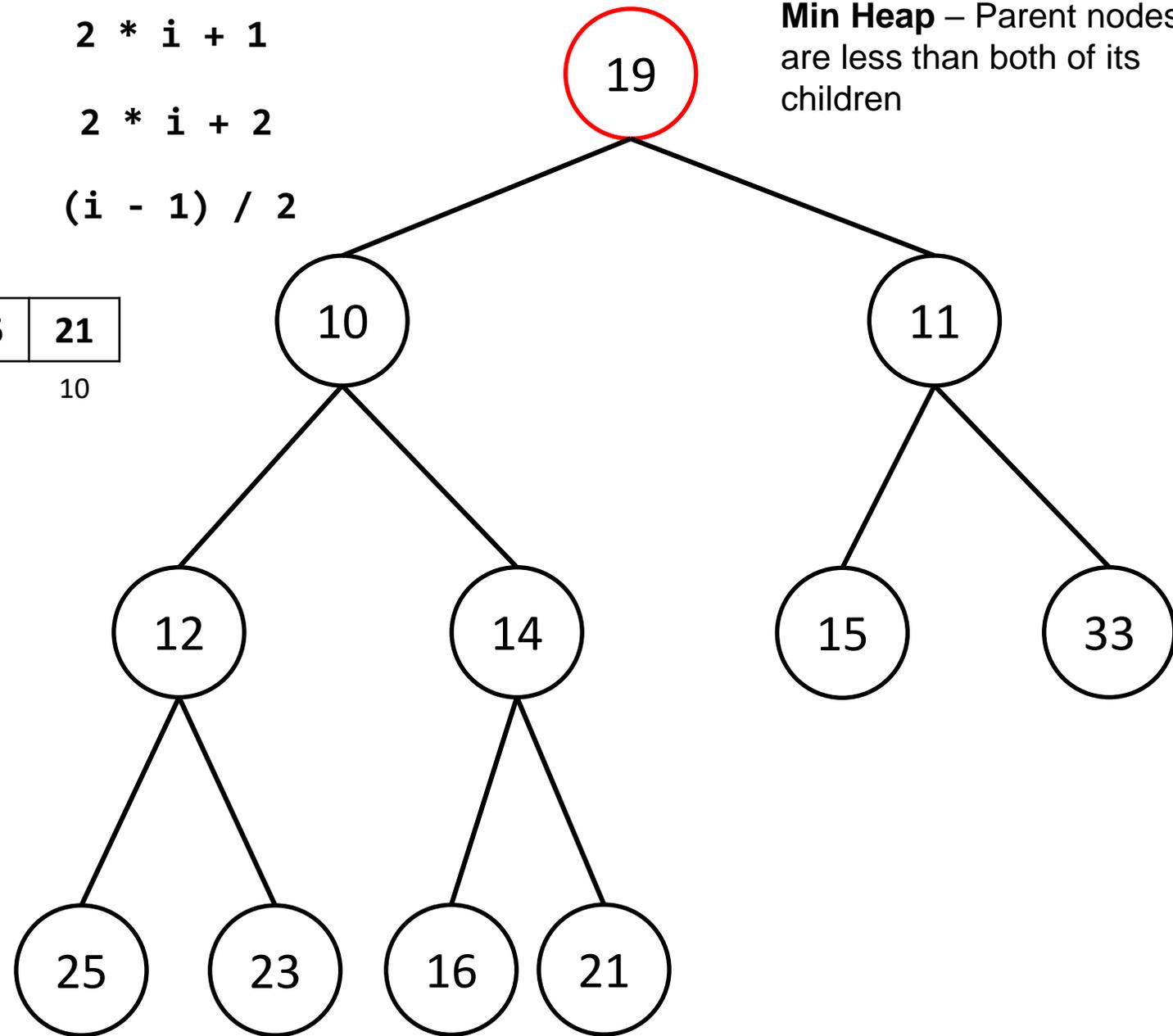
Min Heap – Parent nodes are less than both of its children

Array

$O(1)$ time

19	10	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`



Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

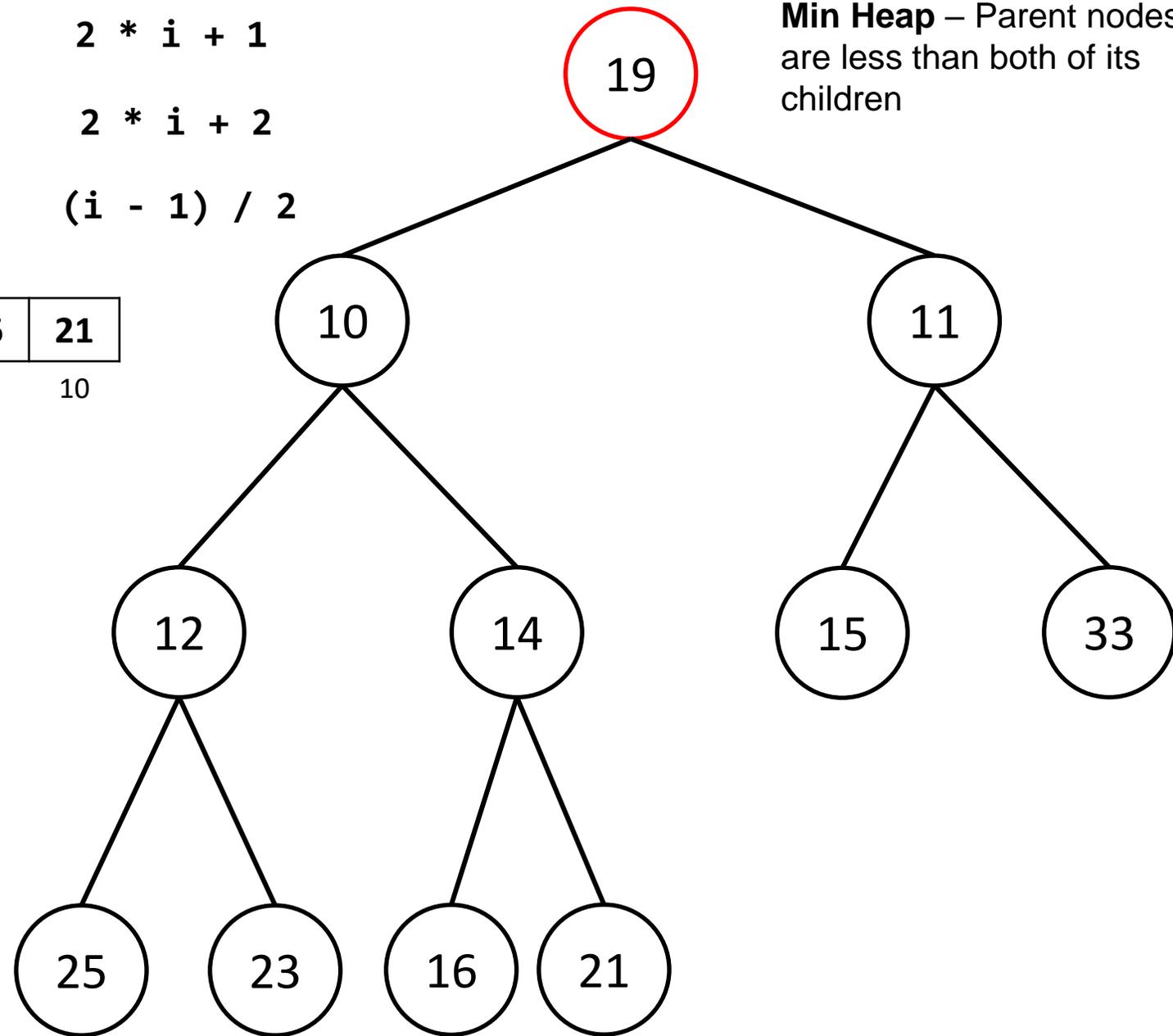
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19	10	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`

Time to Heapify down!



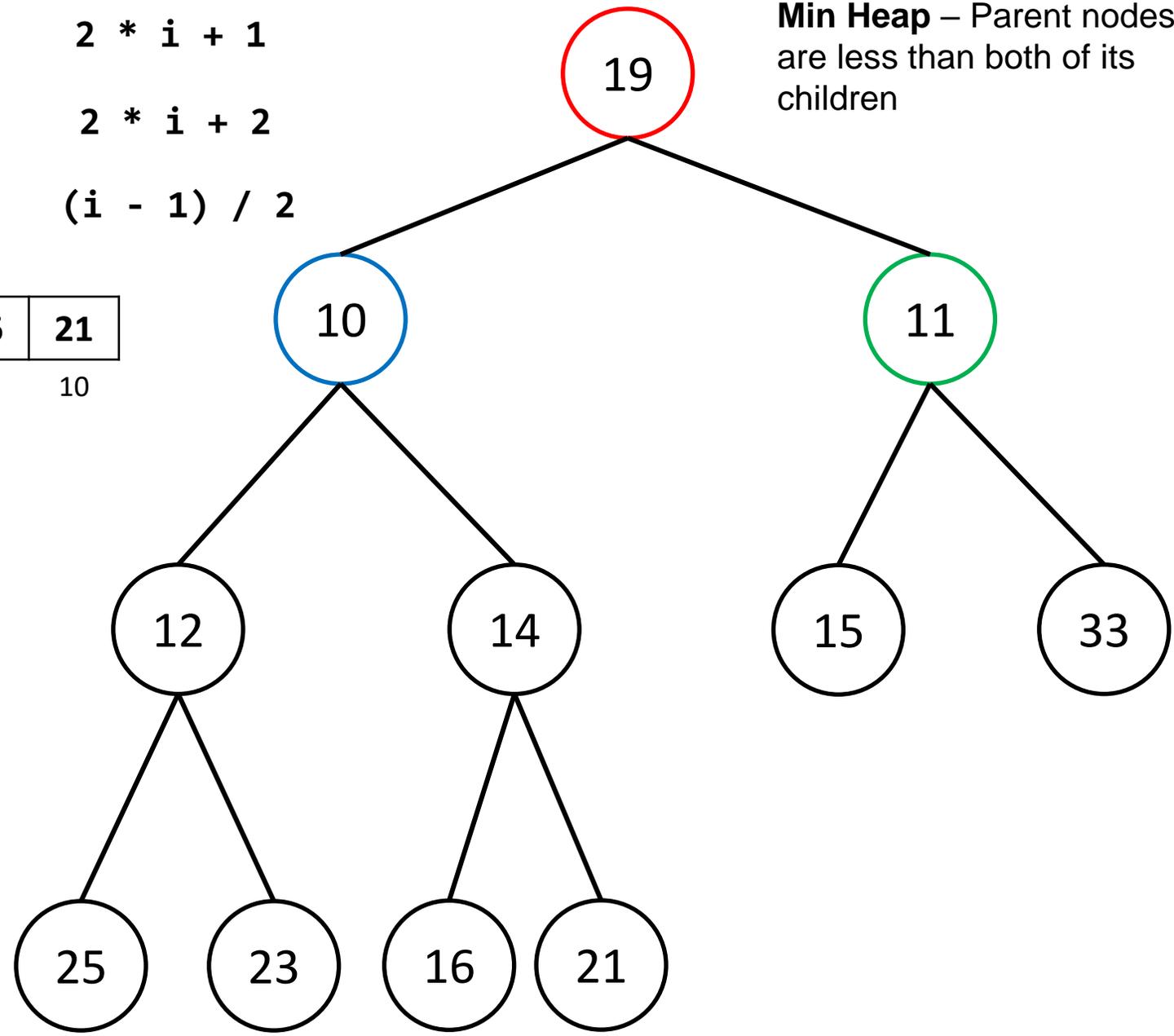
Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

19	10	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



`poll();`

Time to Heapify down!

19's left child is located at $2 * 0 + 1 = 1$

19's right child is located at $2 * 0 + 2 = 2$

(We want to swap it with the lower value)

Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

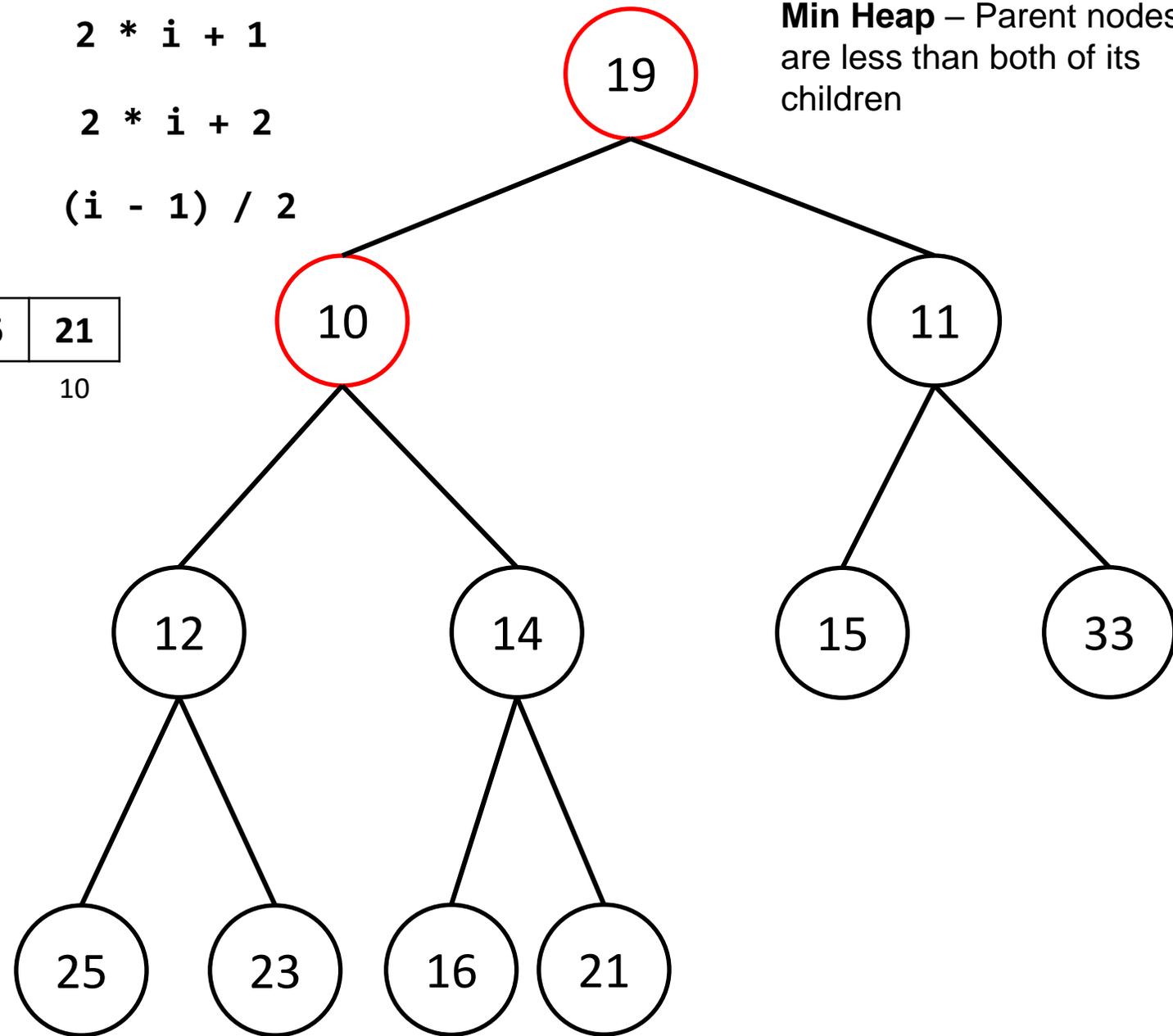
Min Heap – Parent nodes are less than both of its children

Array

19	10	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`

Time to Heapify down!



Heap Representation

Left Child $2 * i + 1$

Right Child $2 * i + 2$

Parent $(i - 1) / 2$

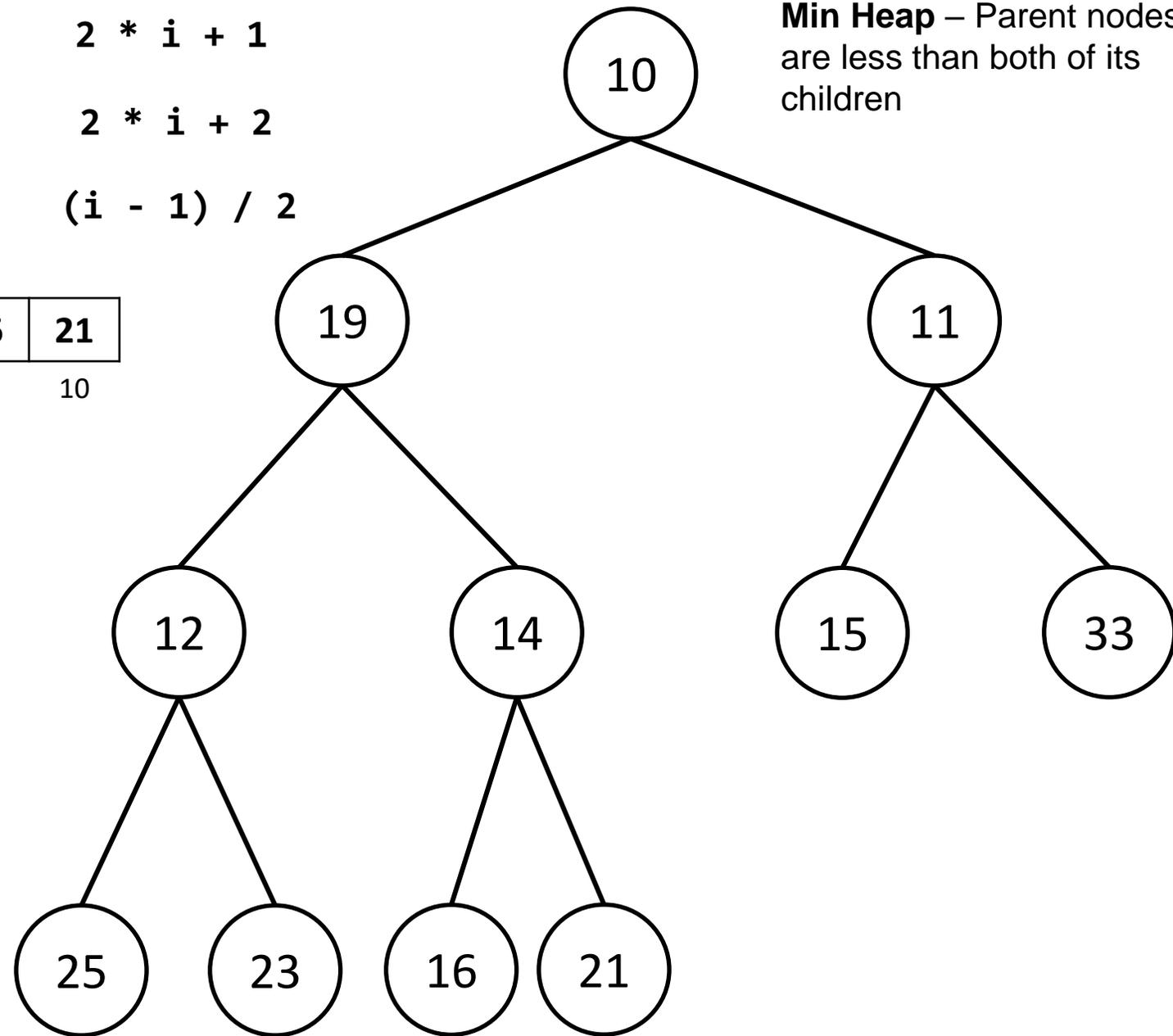
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Array

10	19	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`

Time to Heapify down!



Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

10	19	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

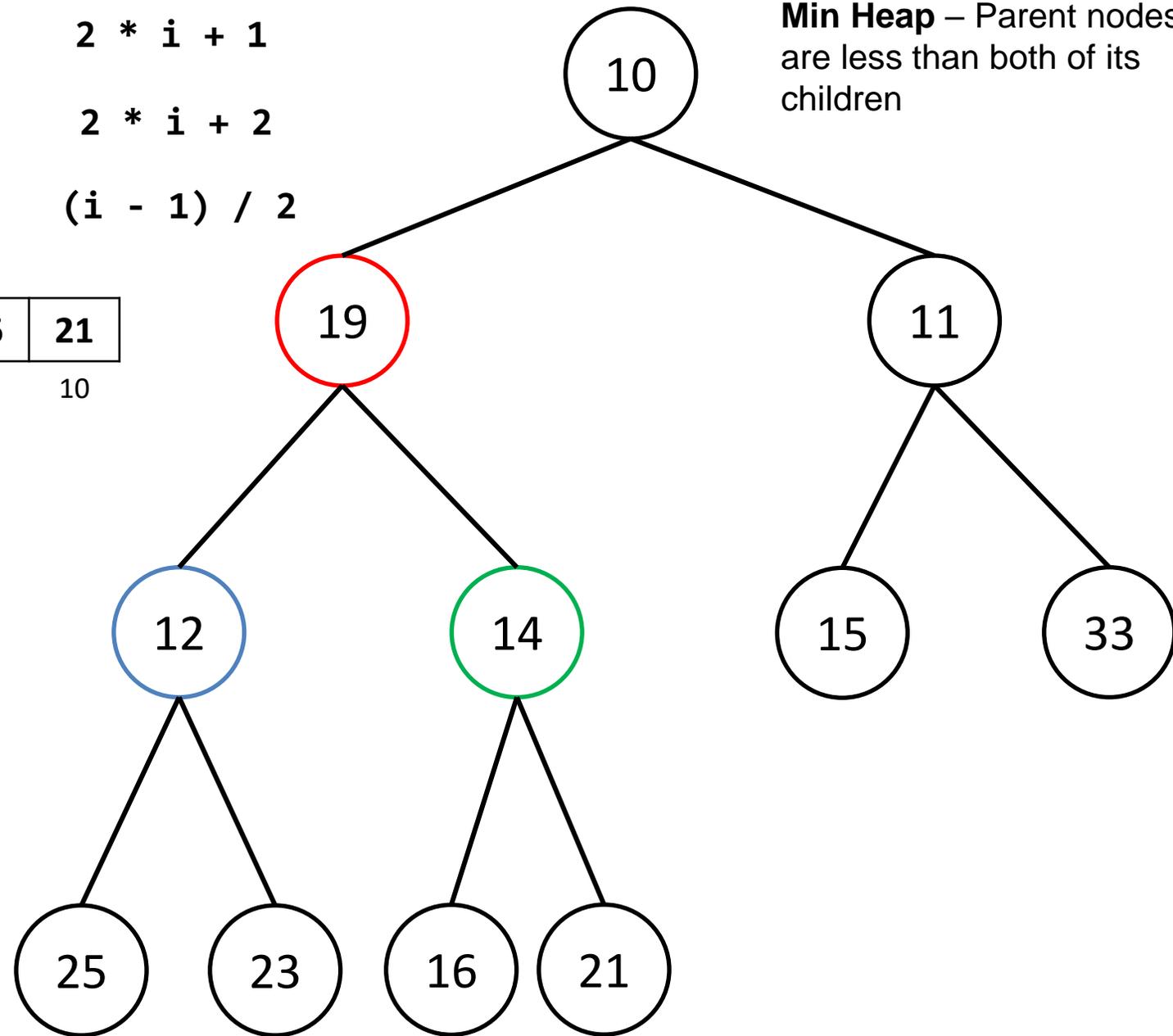
`poll();`

Time to Heapify down!

19's left child is located at $2 * 1 + 1 = 3$

19's right child is located at $2 * 1 + 2 = 4$

(We want to swap it with the lower value)



Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

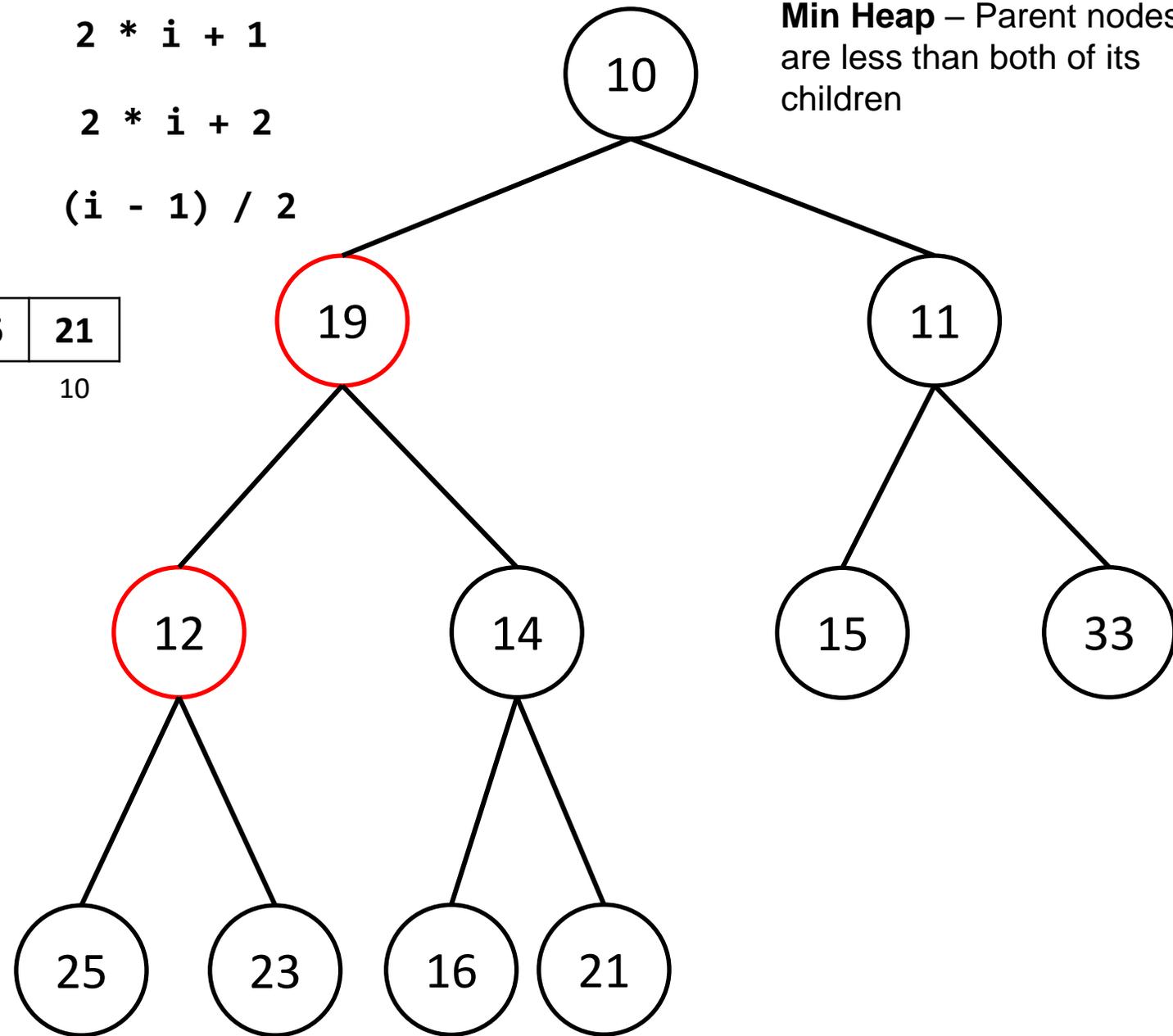
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Array

10	19	11	12	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`

Time to Heapify down!



Heap Representation

Left Child $2 * i + 1$
Right Child $2 * i + 2$
Parent $(i - 1) / 2$

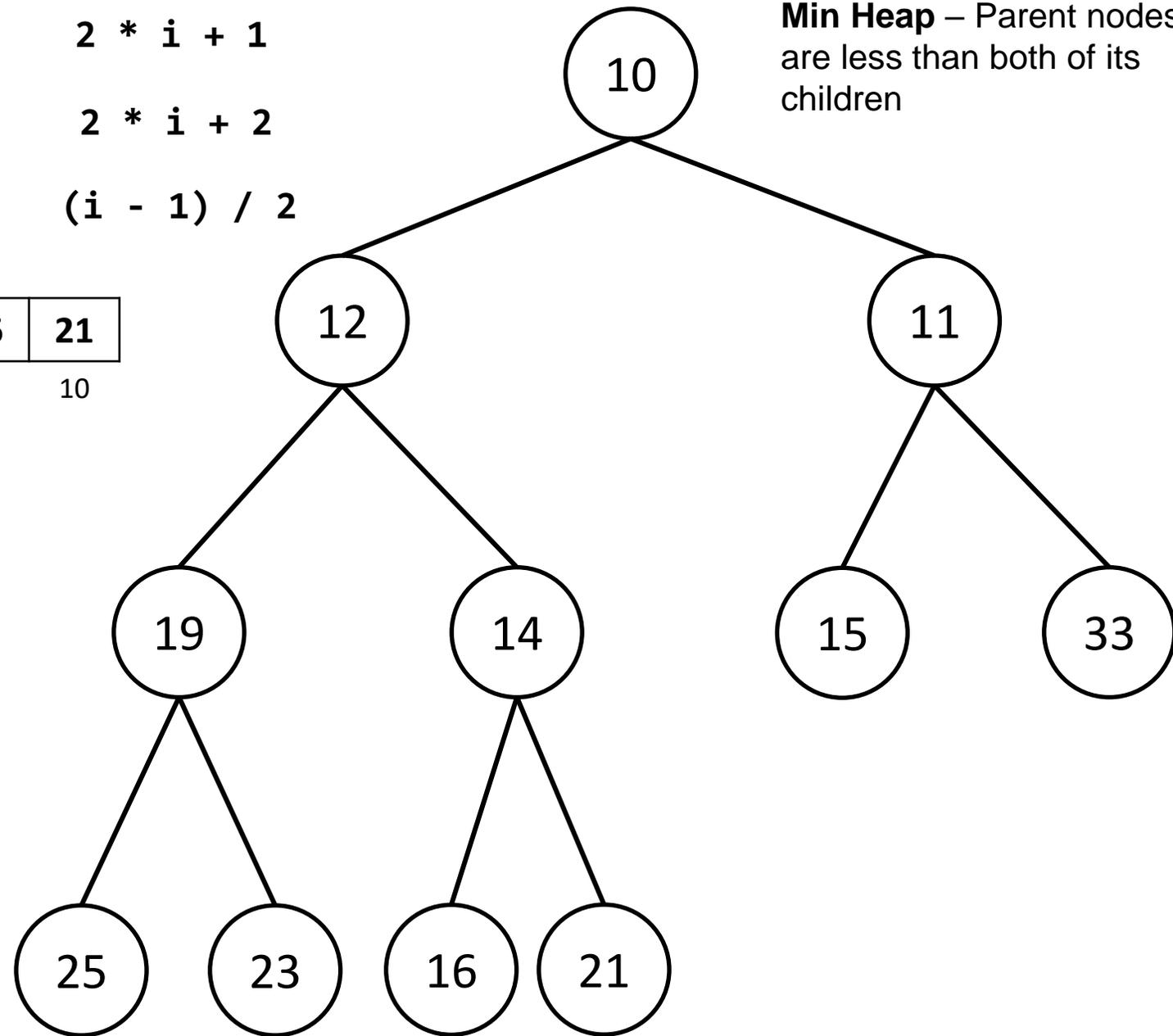
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Array

10	12	11	19	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10

`poll();`

Time to Heapify down!



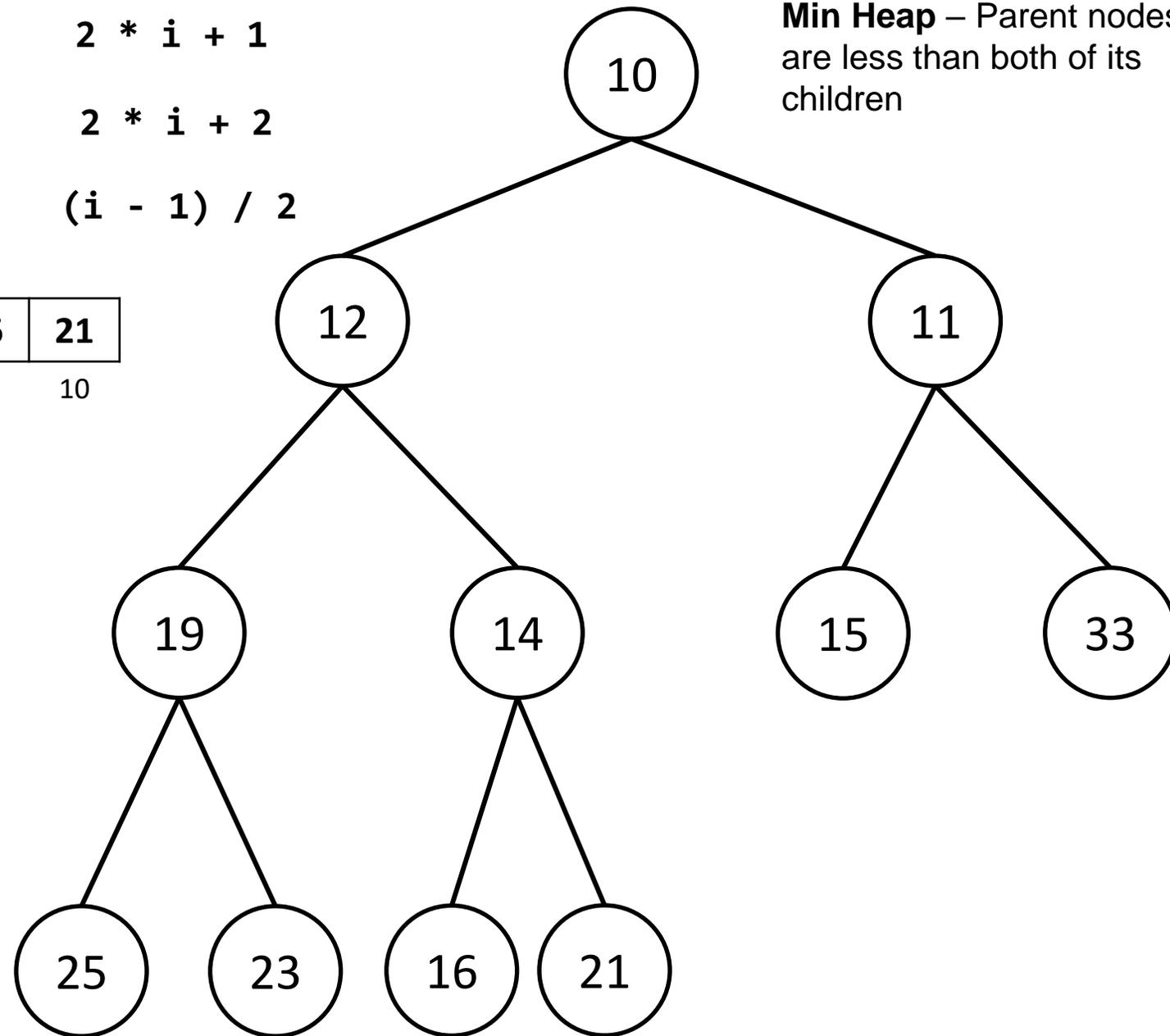
Heap Representation

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10	12	11	19	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



`poll();`

Time to Heapify down!



Heap Representation

Left Child $2 * i + 1$

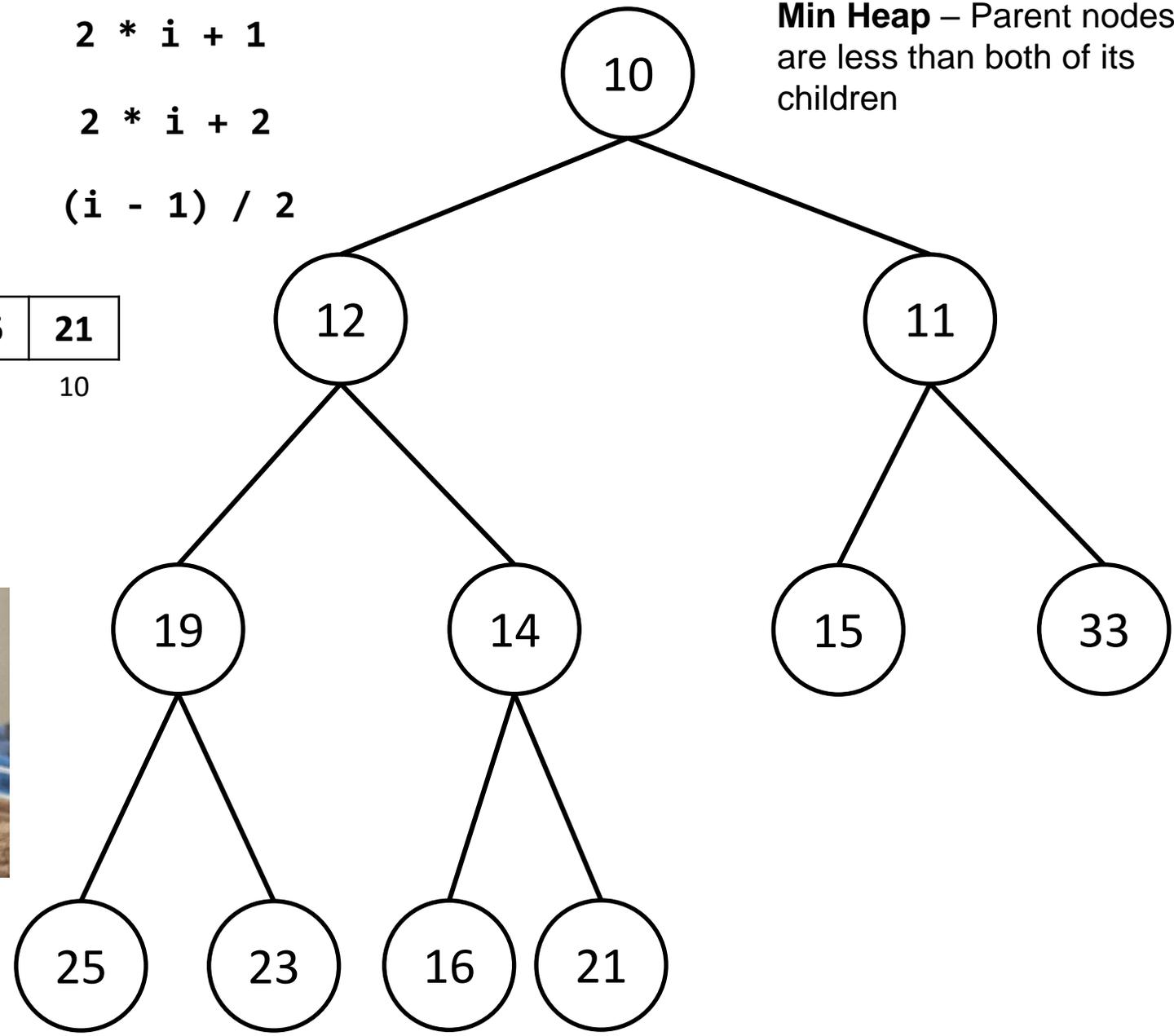
Right Child $2 * i + 2$

Parent $(i - 1) / 2$

Min Heap – Parent nodes are less than both of its children

Array

10	12	11	19	14	15	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



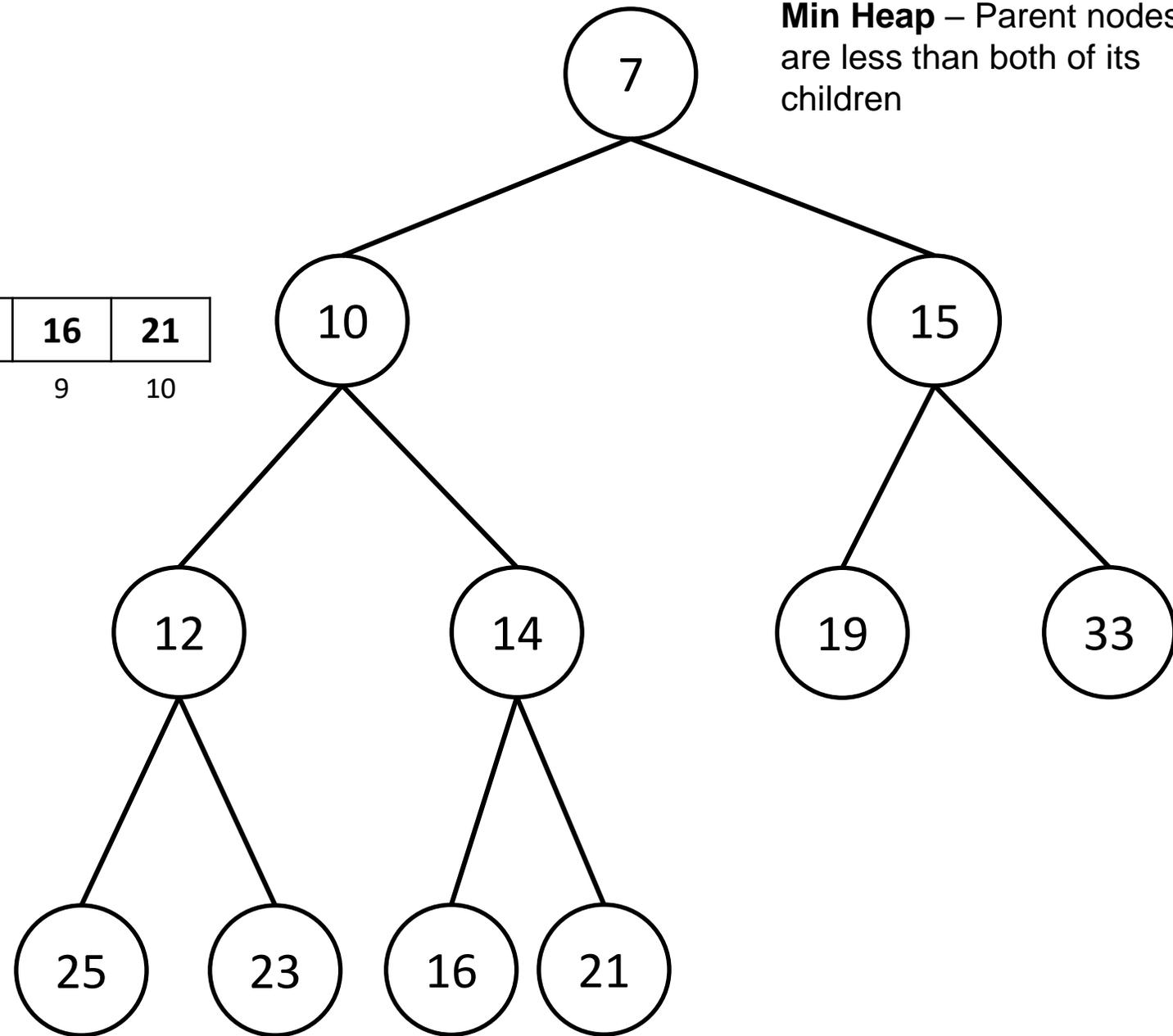
Let's code this!!!



Min Heap – Parent nodes are less than both of its children

Array

7	10	15	12	14	19	33	25	23	16	21
0	1	2	3	4	5	6	7	8	9	10



What can a Heap do well that other data structures cannot as well?

What can a Heap do well that other data structures cannot as well?

Finding the largest/smallest element happens in **$O(1)$** time

Because we use an array, it might be more memory efficient than a standard tree

Does a Heap remind you of any other data structures?

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Priority Queue

Does a Heap remind you of any other data structures?

Priority Queue

Whenever we remove an element, we always remove the smallest/largest value (`poll()`)

Whenever we add an element, it initially gets added to the back of the array, and then swaps itself within the array

Takeaways

A Heap is a priority queue

Whenever we remove an element, we always remove the smallest/largest value (`poll()`)

Whenever we add an element, it initially gets added to the back of the array, and then swaps itself within the array

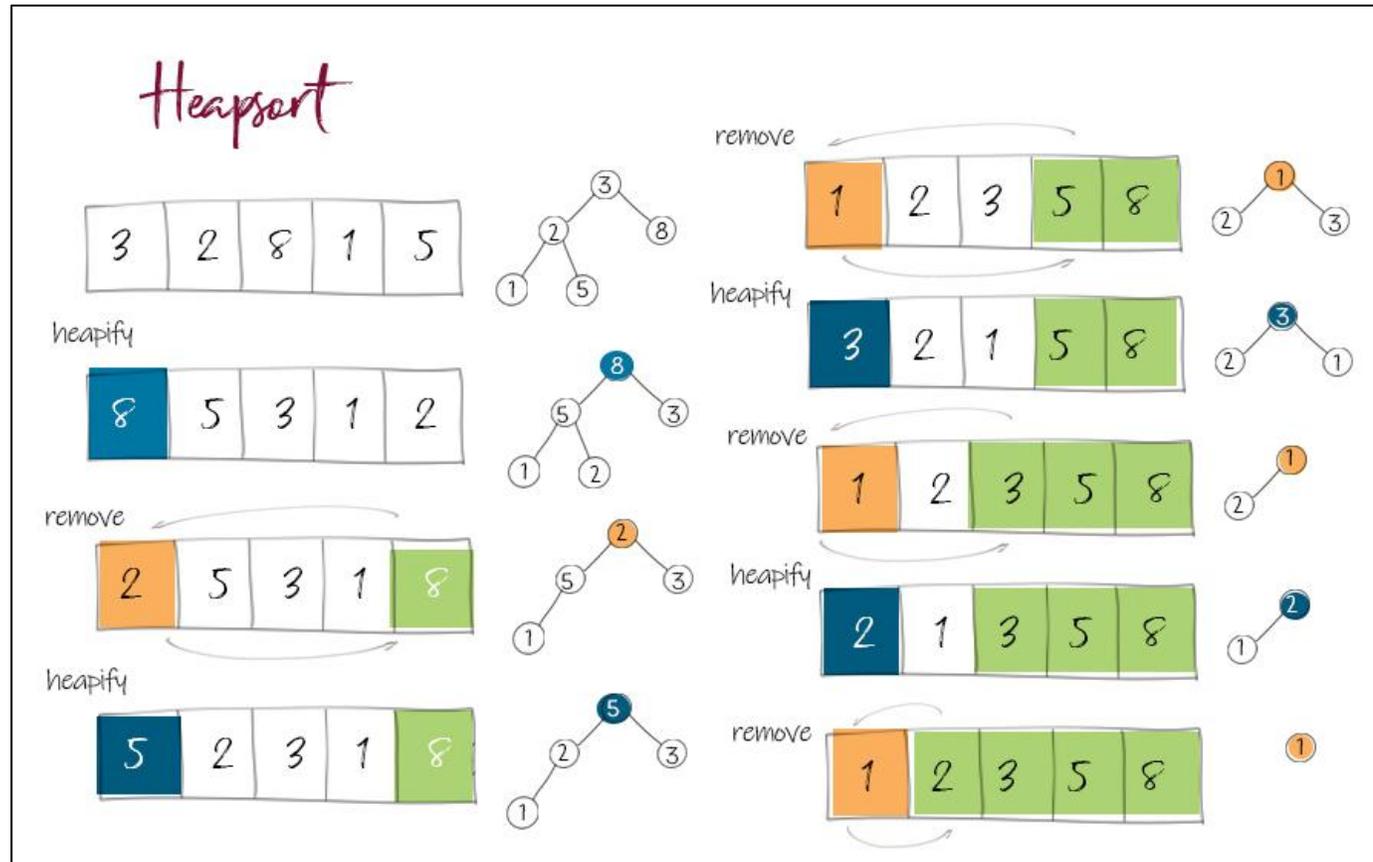
Getting the maximum/minimum value happens in $O(1)$ time

Class PriorityQueue<E>

There is a section of memory in your computer called “The Heap”, which is something totally unrelated to this data structure

Applications

Heapsort- Sorting algorithm that converts an unsorted array to a Heap, and then repeatedly remove the root node

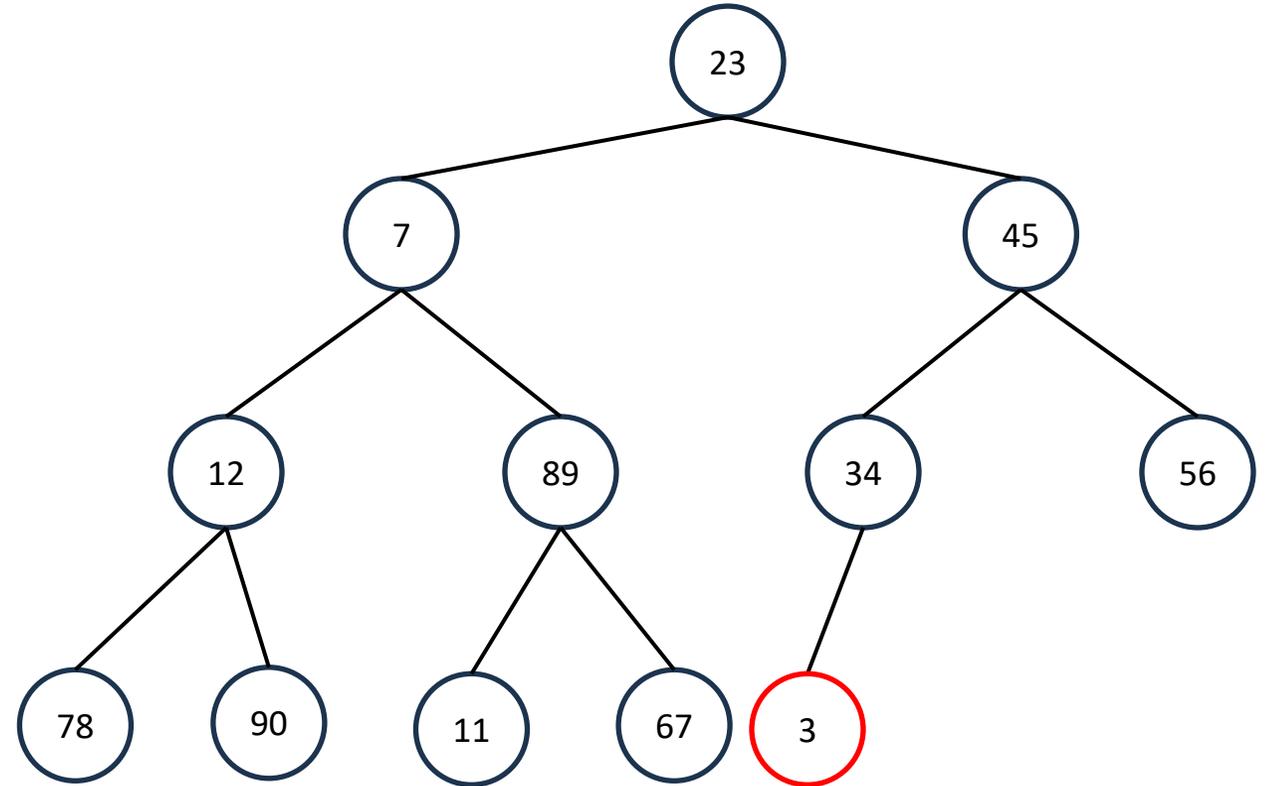


Heap Sort

`int[] data = {23, 7, 45, 12, 89, 34, 56, 78, 90, 11, 67, 3}`

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

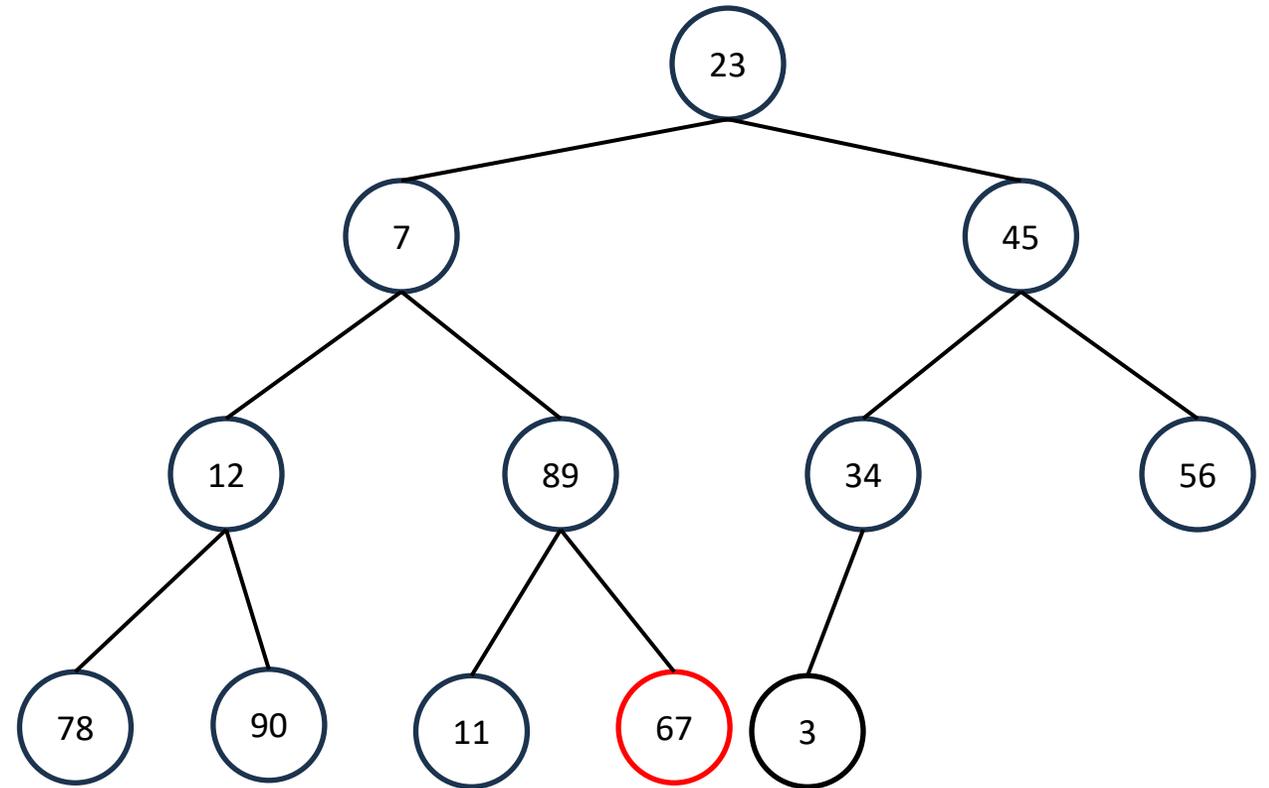


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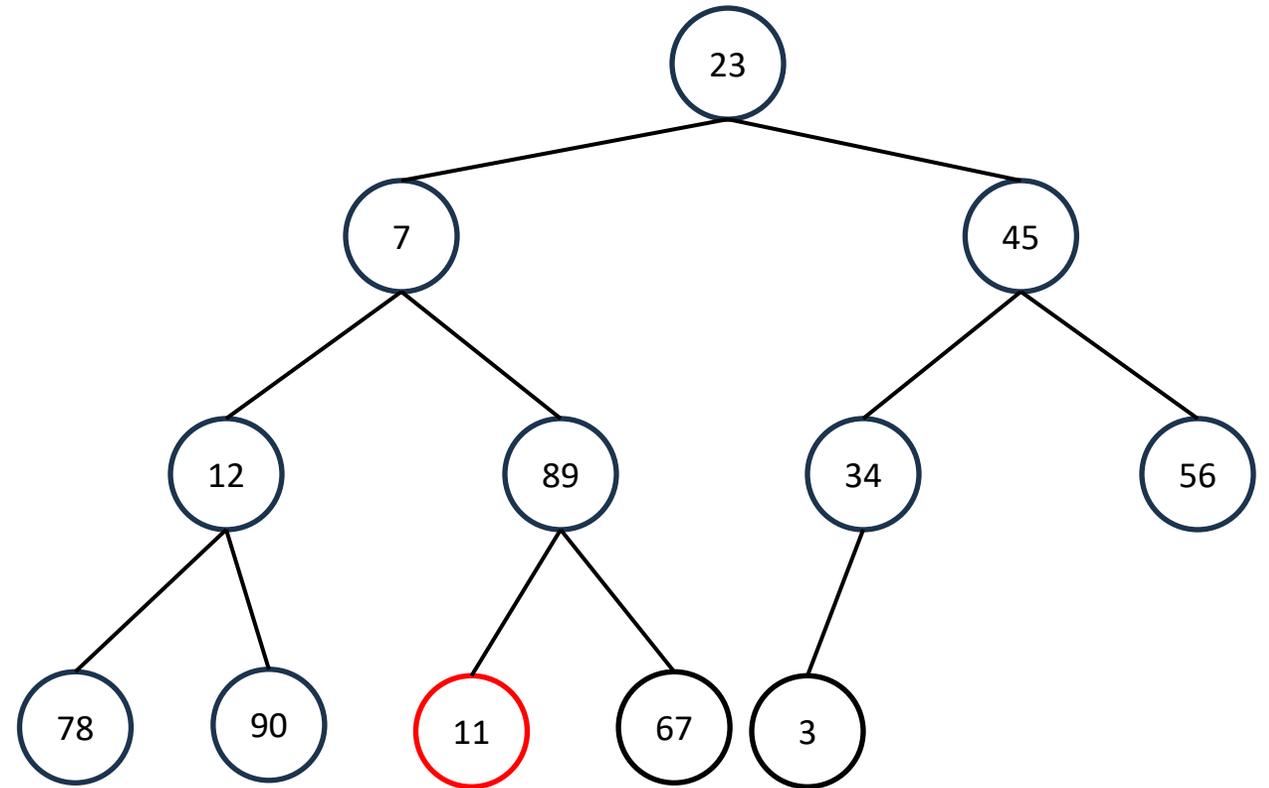


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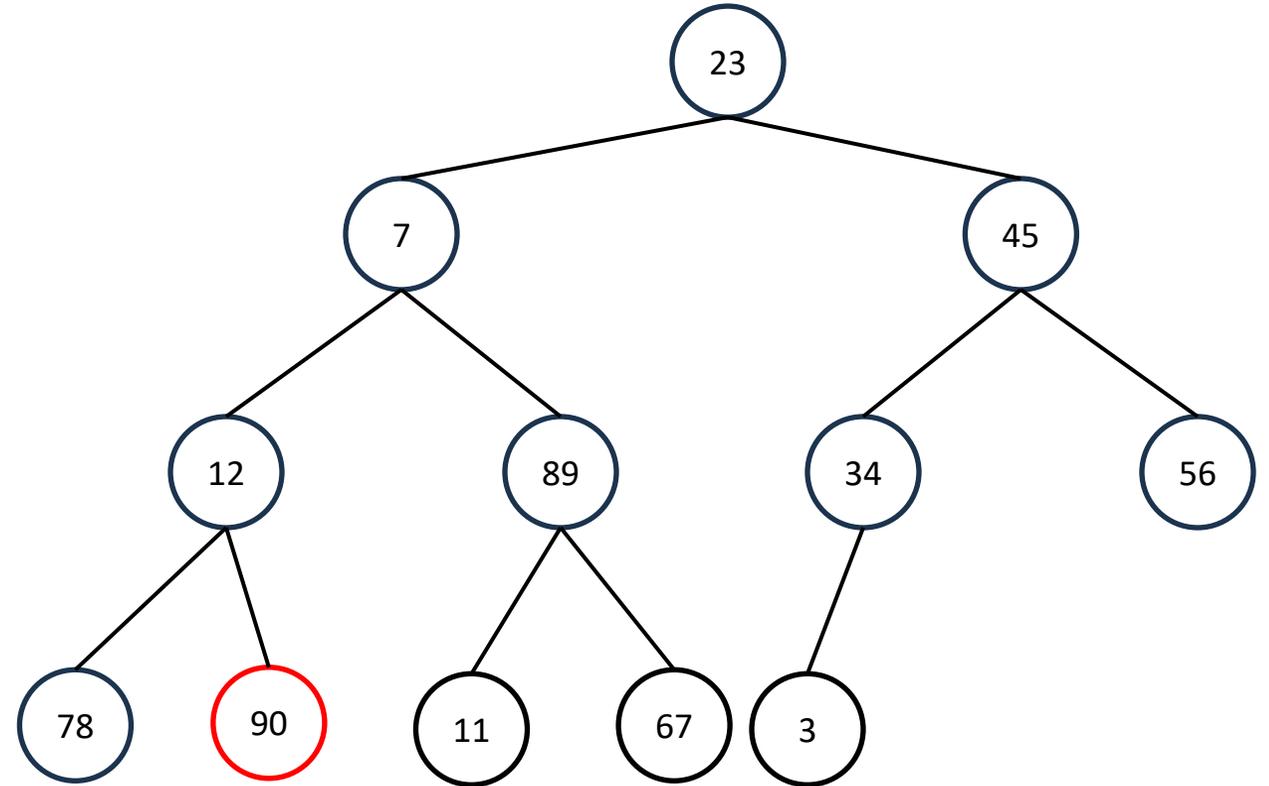


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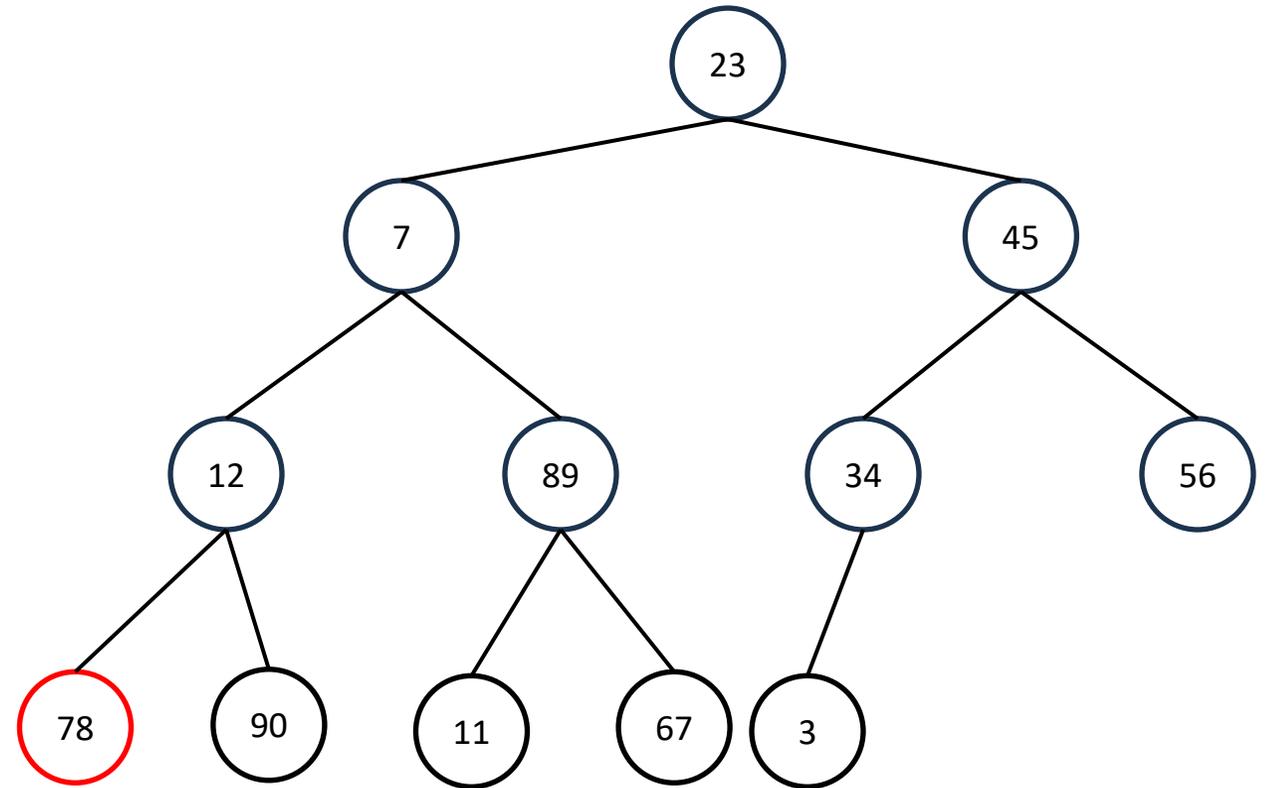


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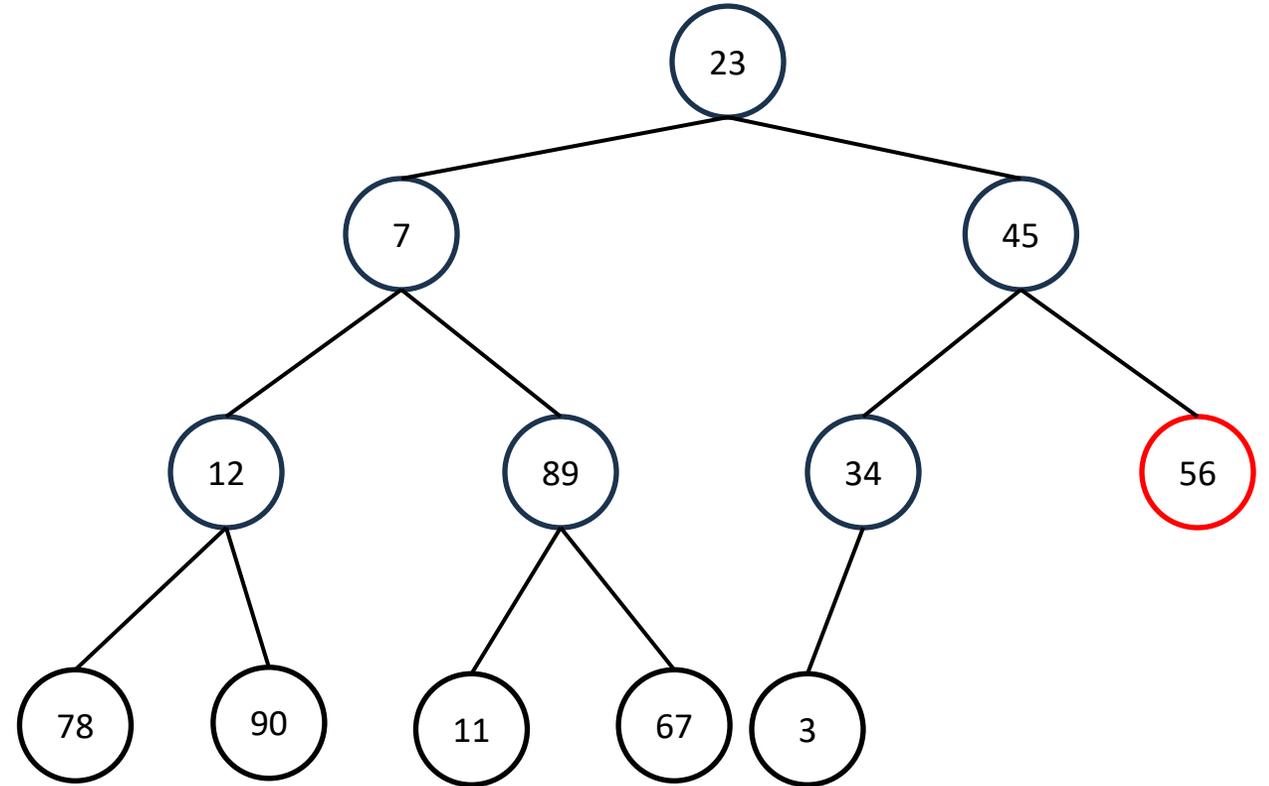


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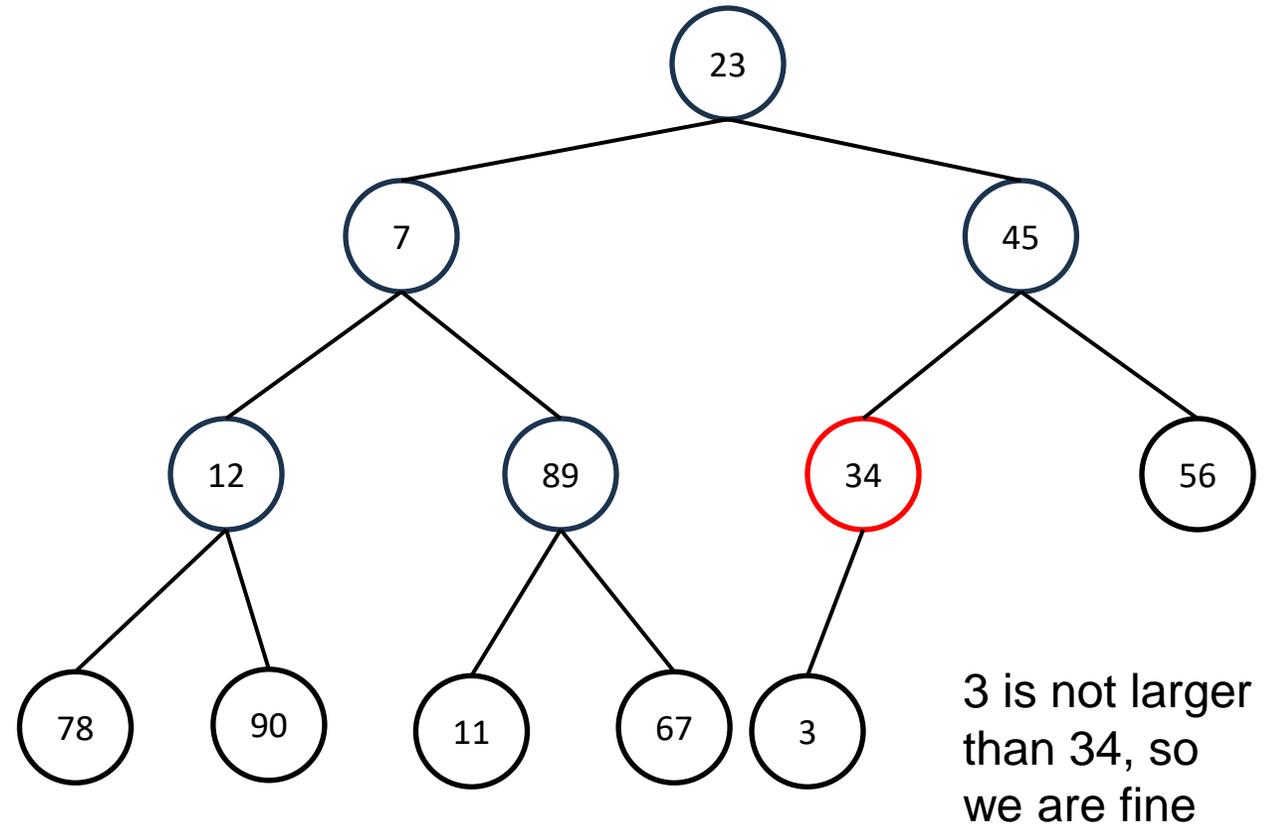


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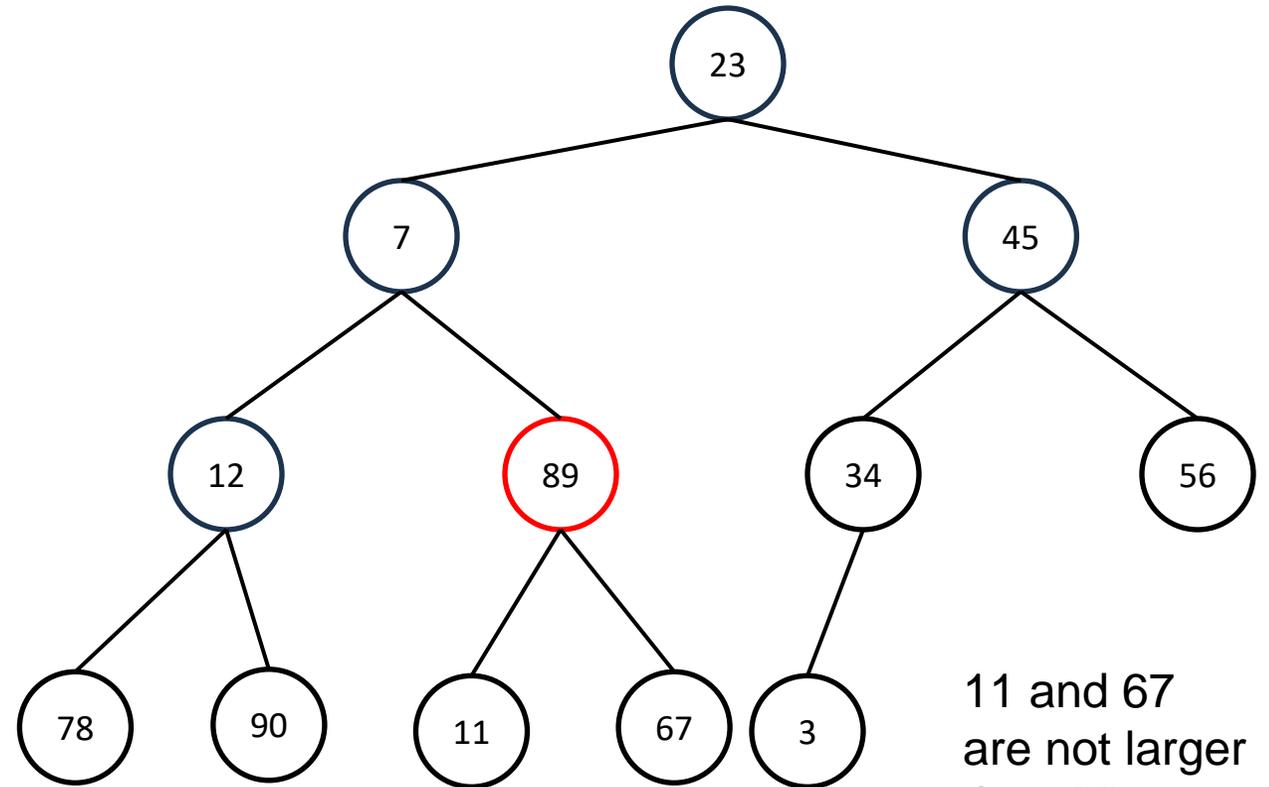


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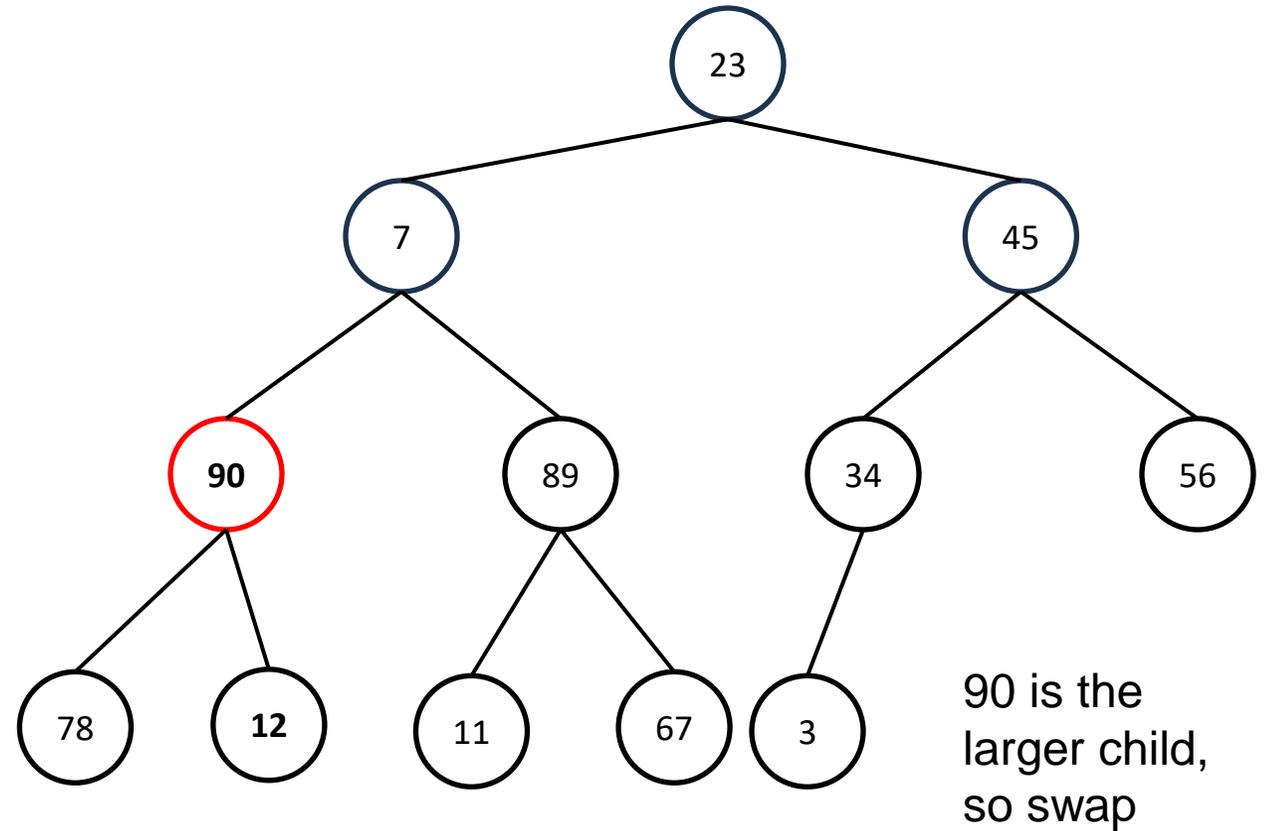
11 and 67
are not larger
than 89, so
continue

Heap Sort

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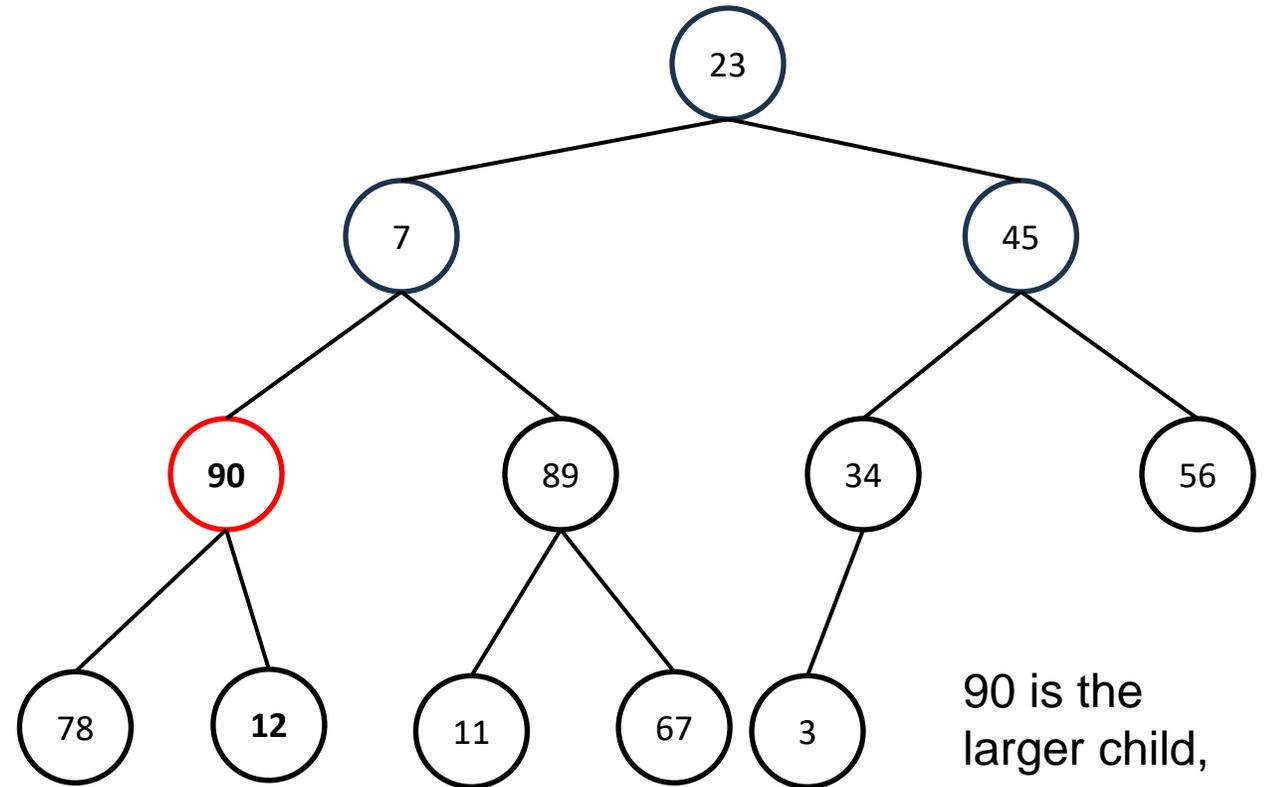


Heap Sort

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90 is the larger child, so swap

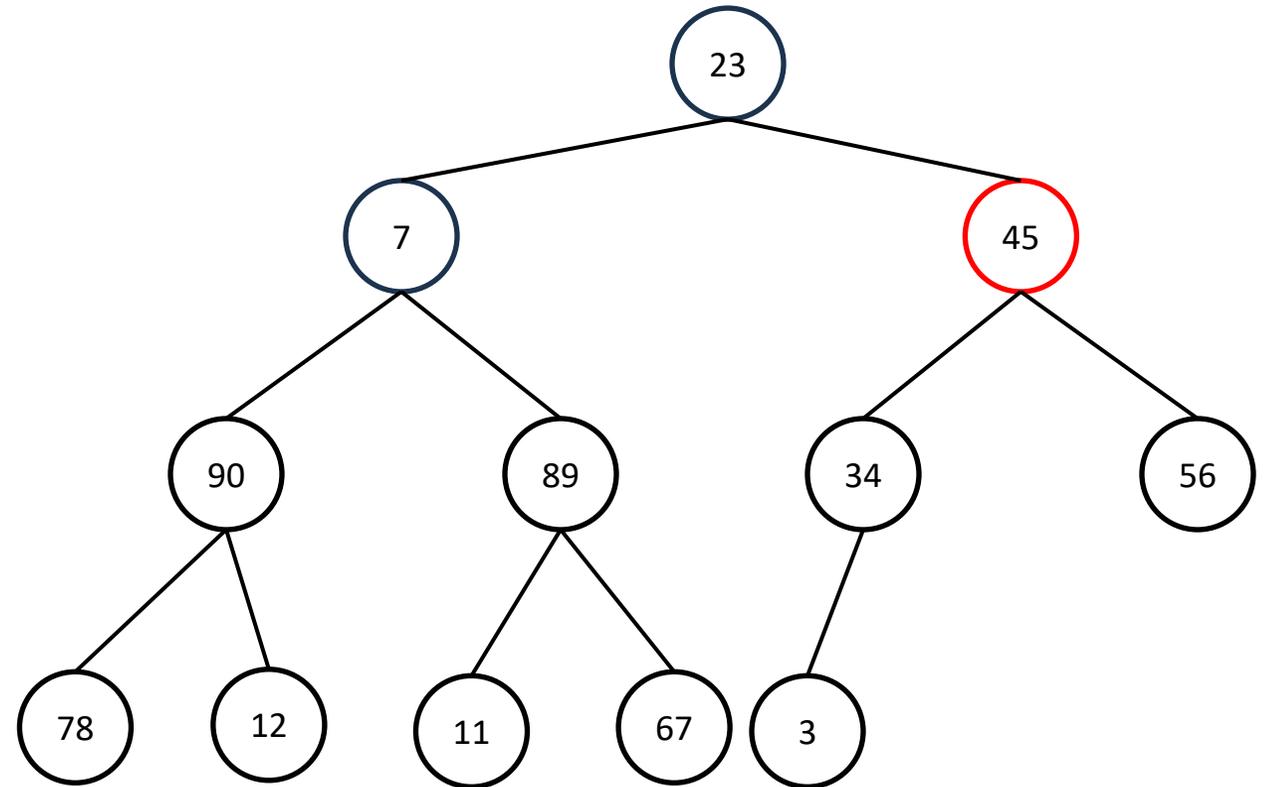
90 is larger than 78 and 12 so continue

Heap Sort

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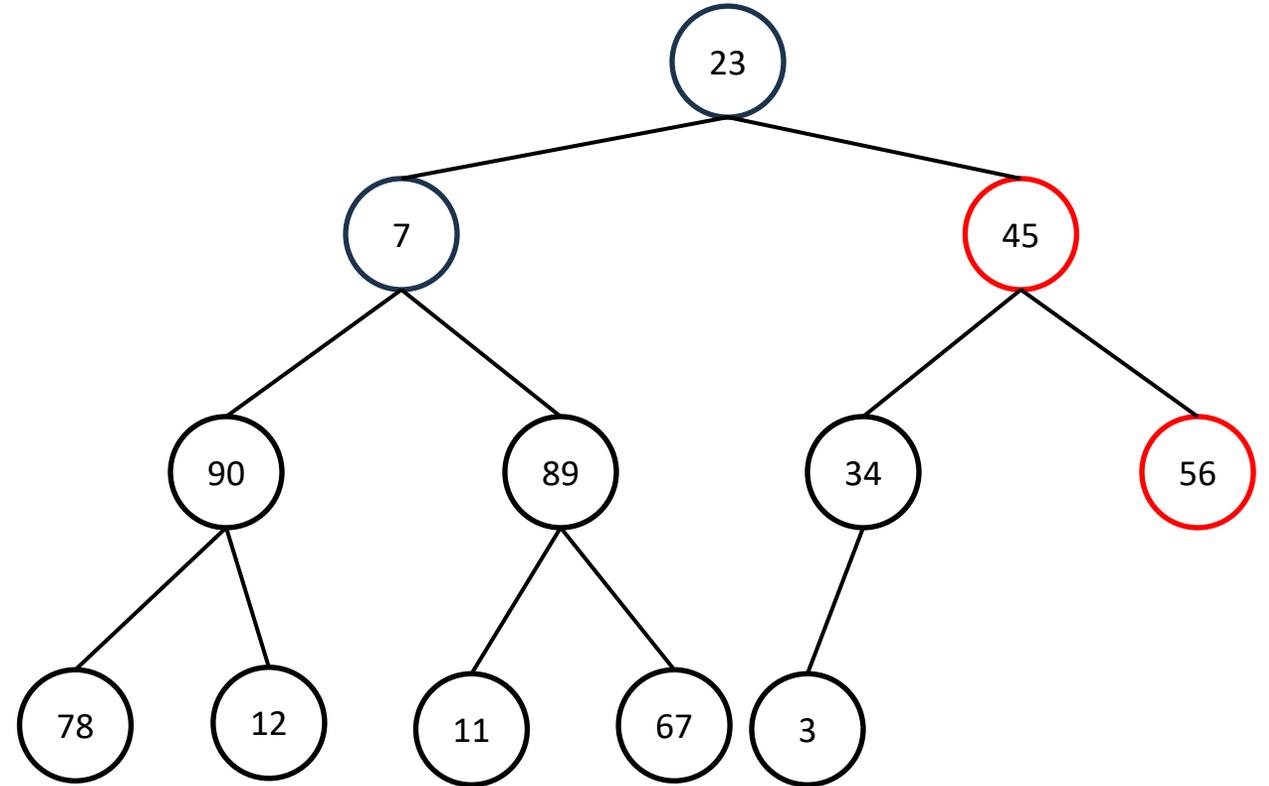


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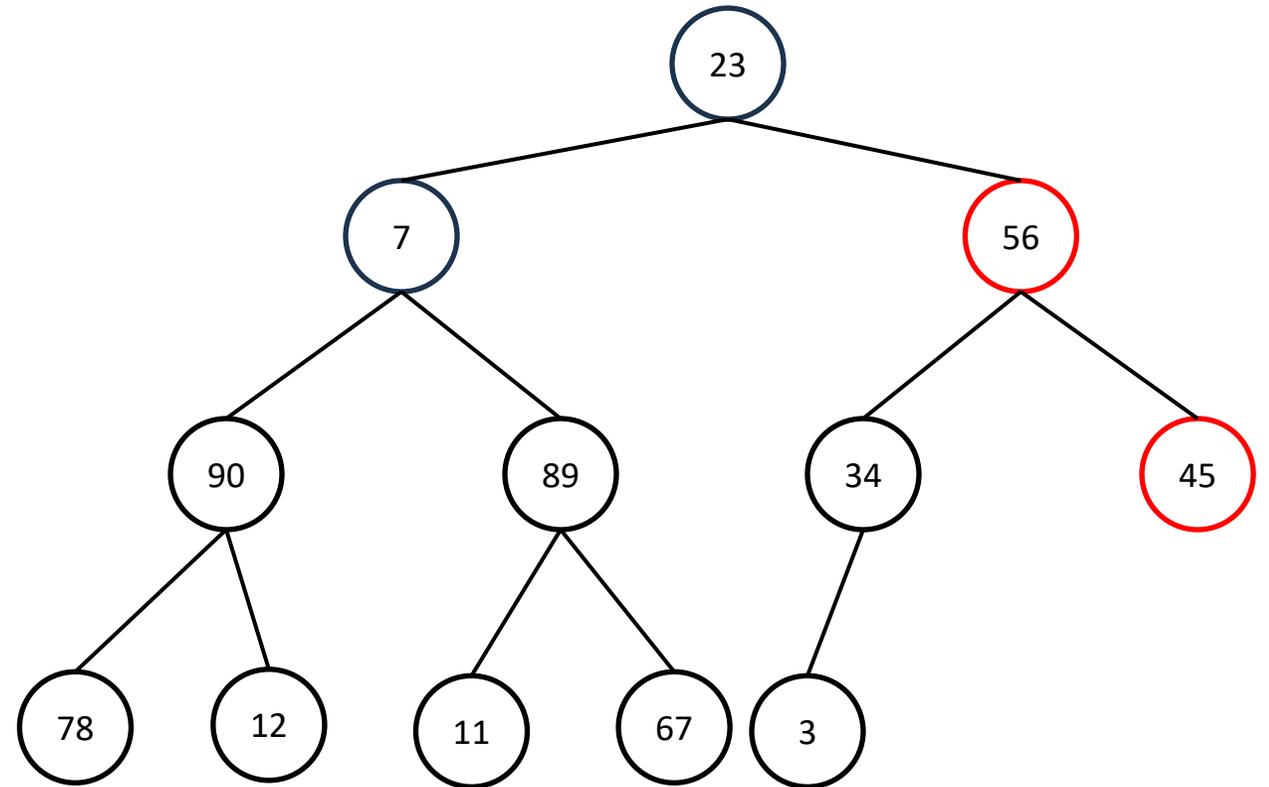


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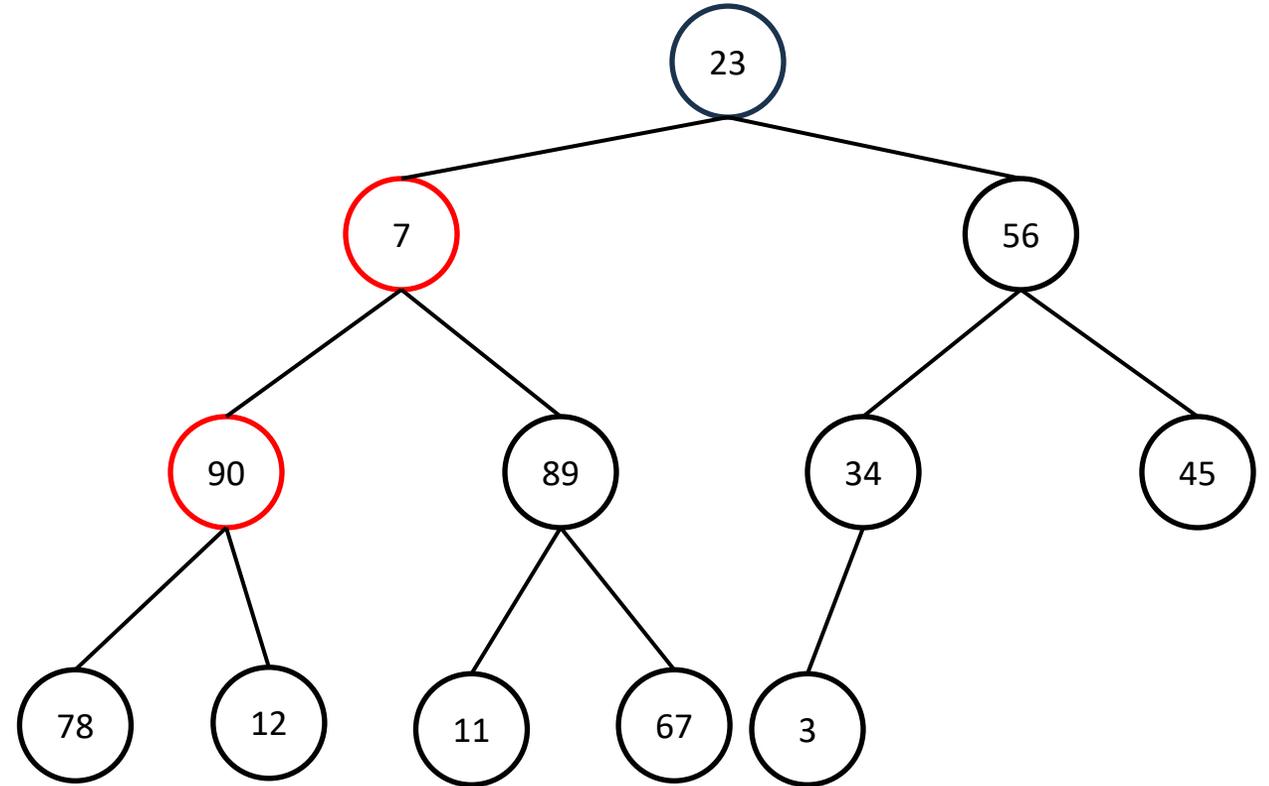


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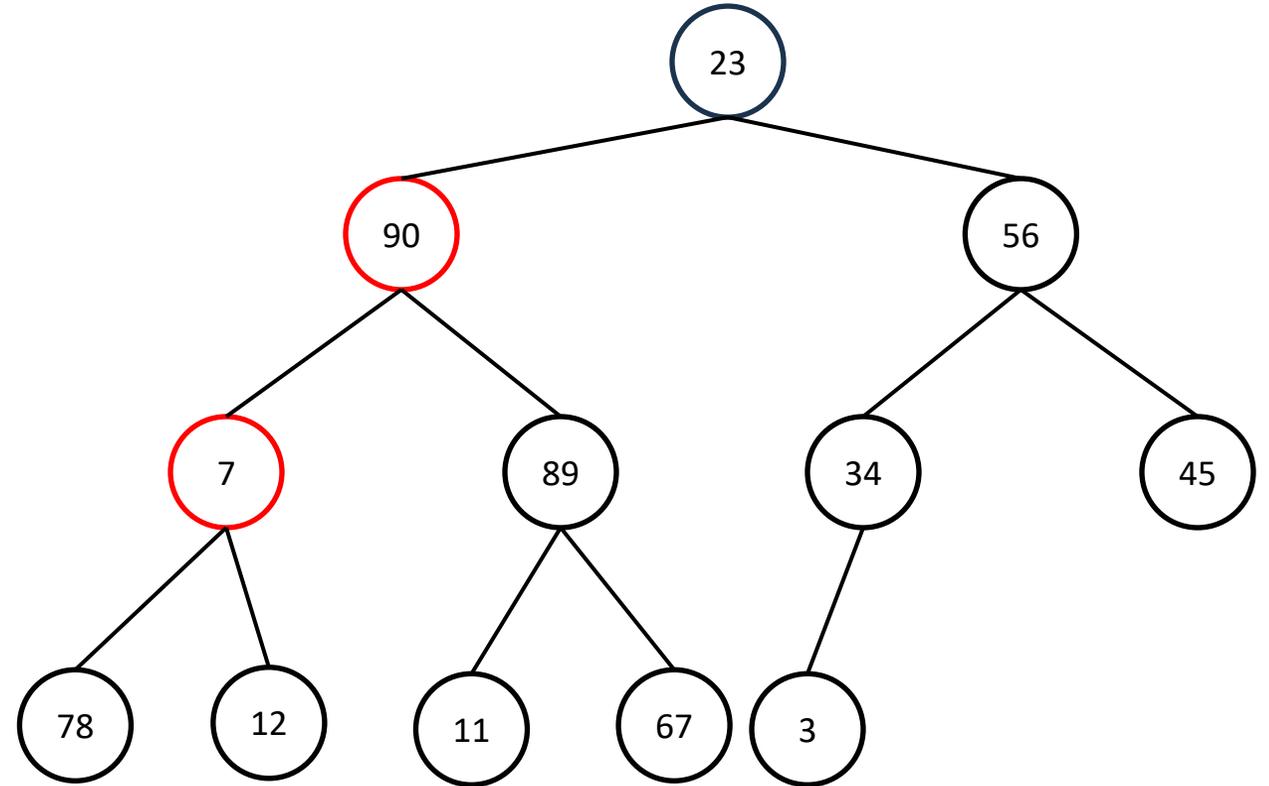


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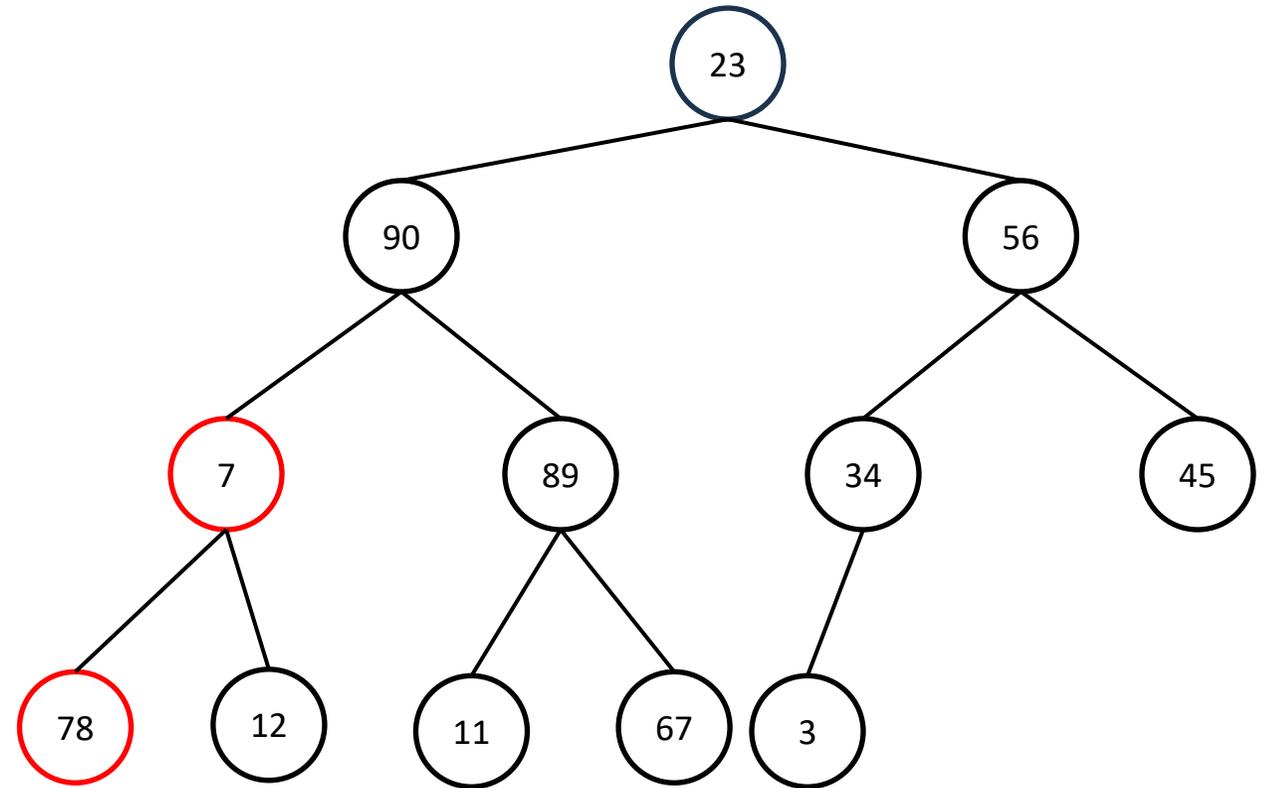
Heapify Down 7 !

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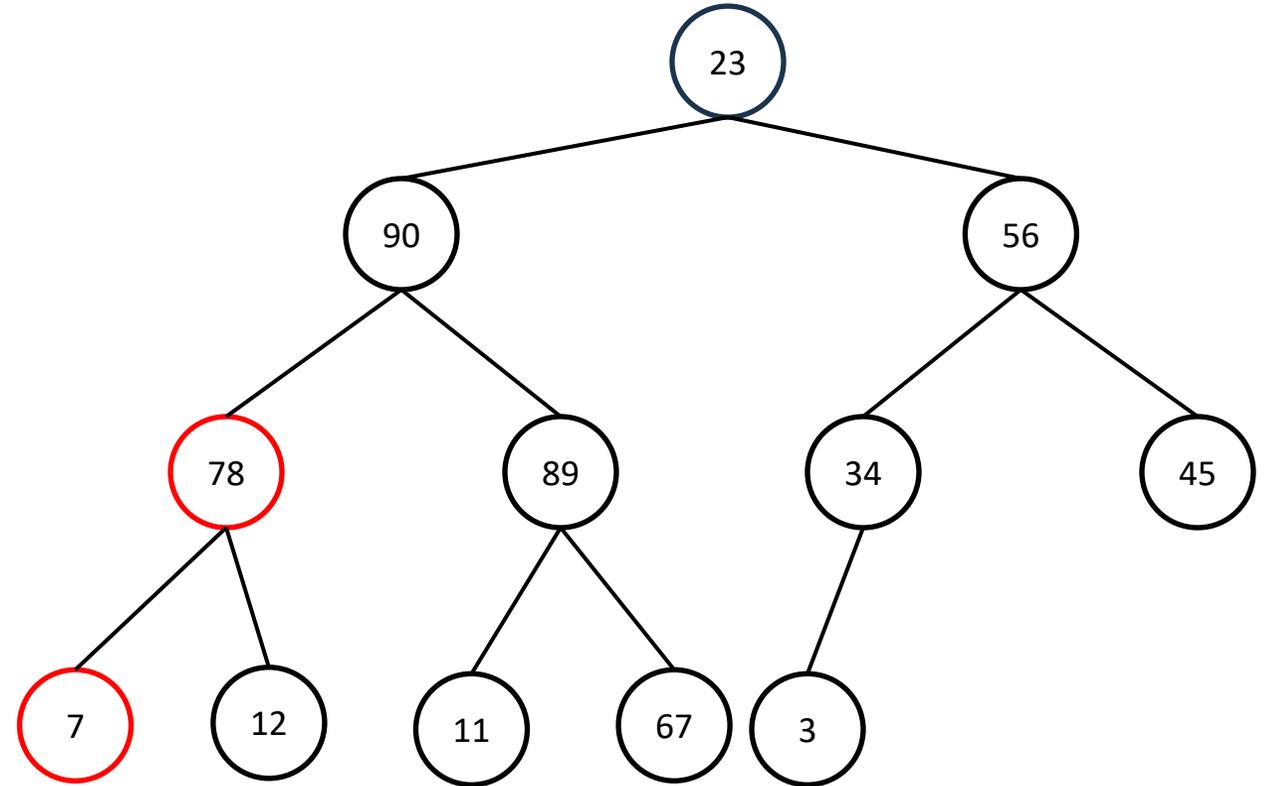
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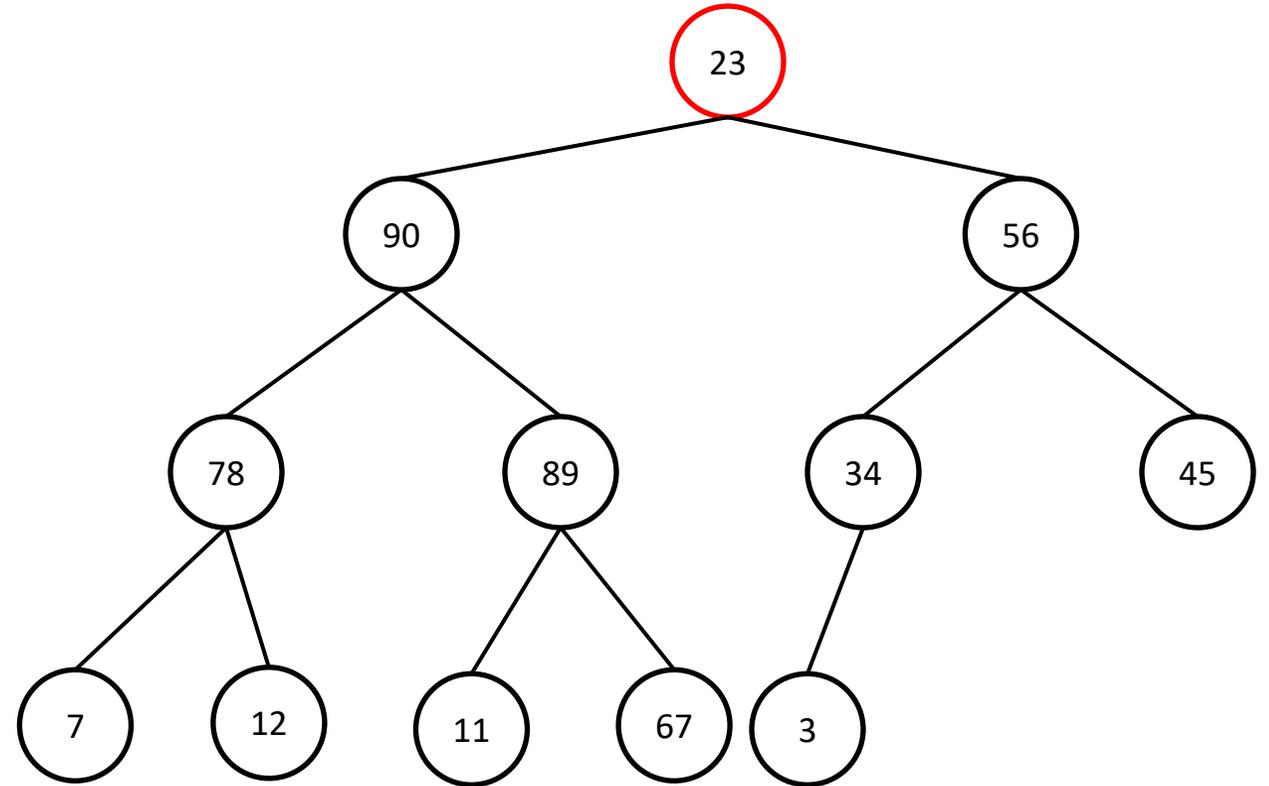
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1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger



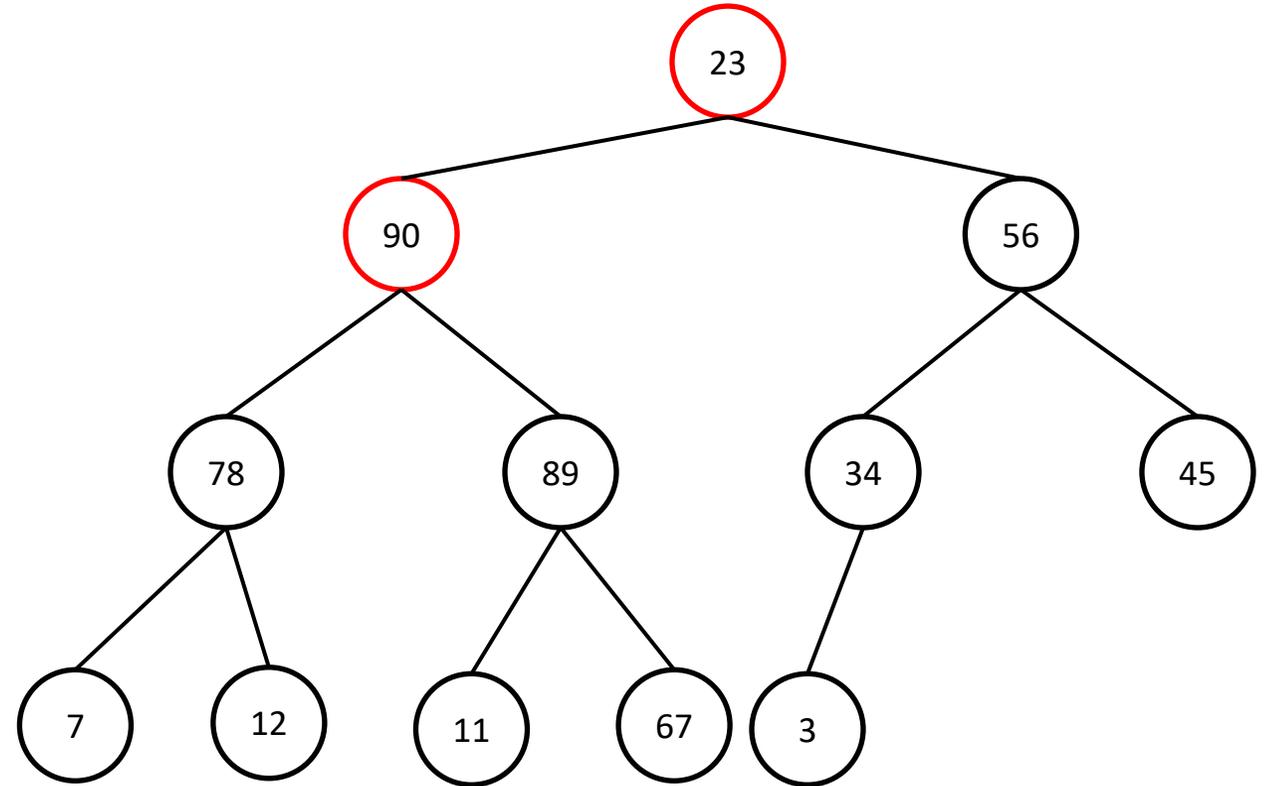
Heapify down 23 !

Heap Sort

int[] data = {23, 90, 56, 78, 89, 34, 45, 7, 12, 11, 67, 3}

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger



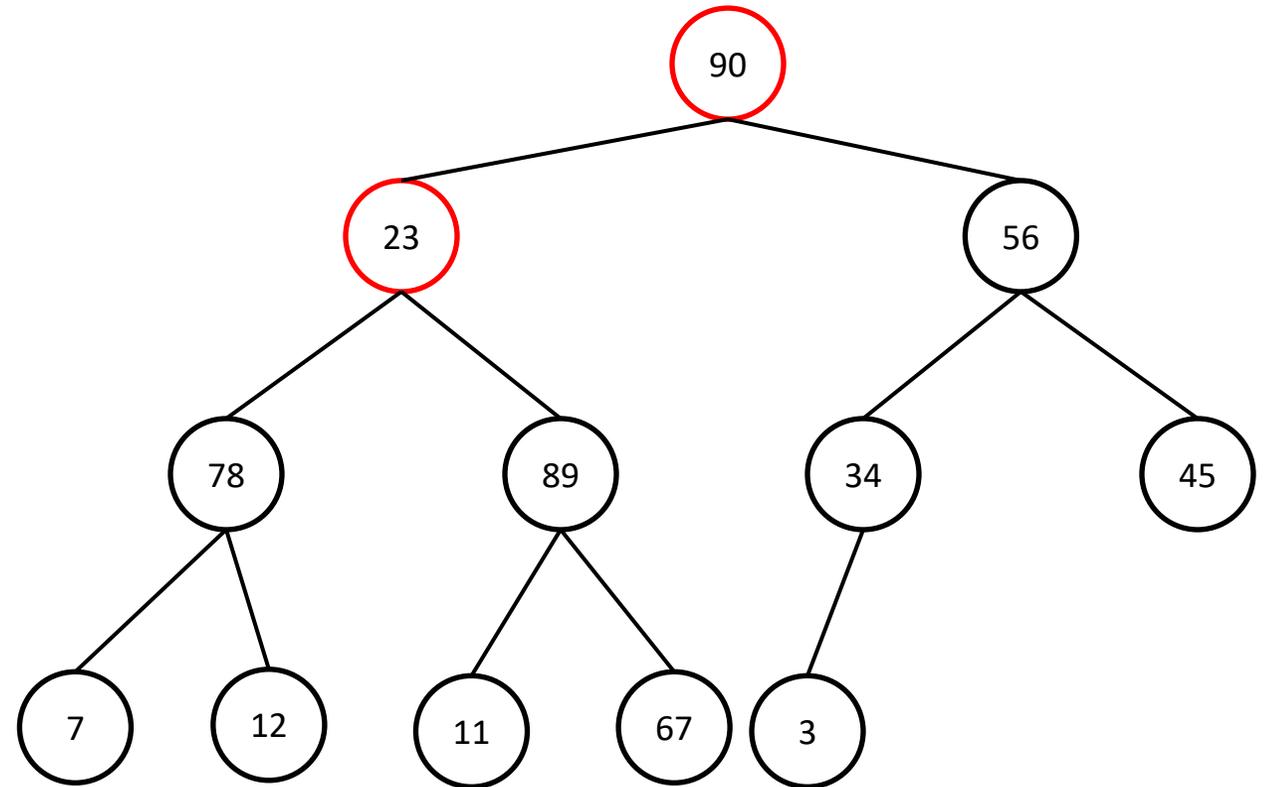
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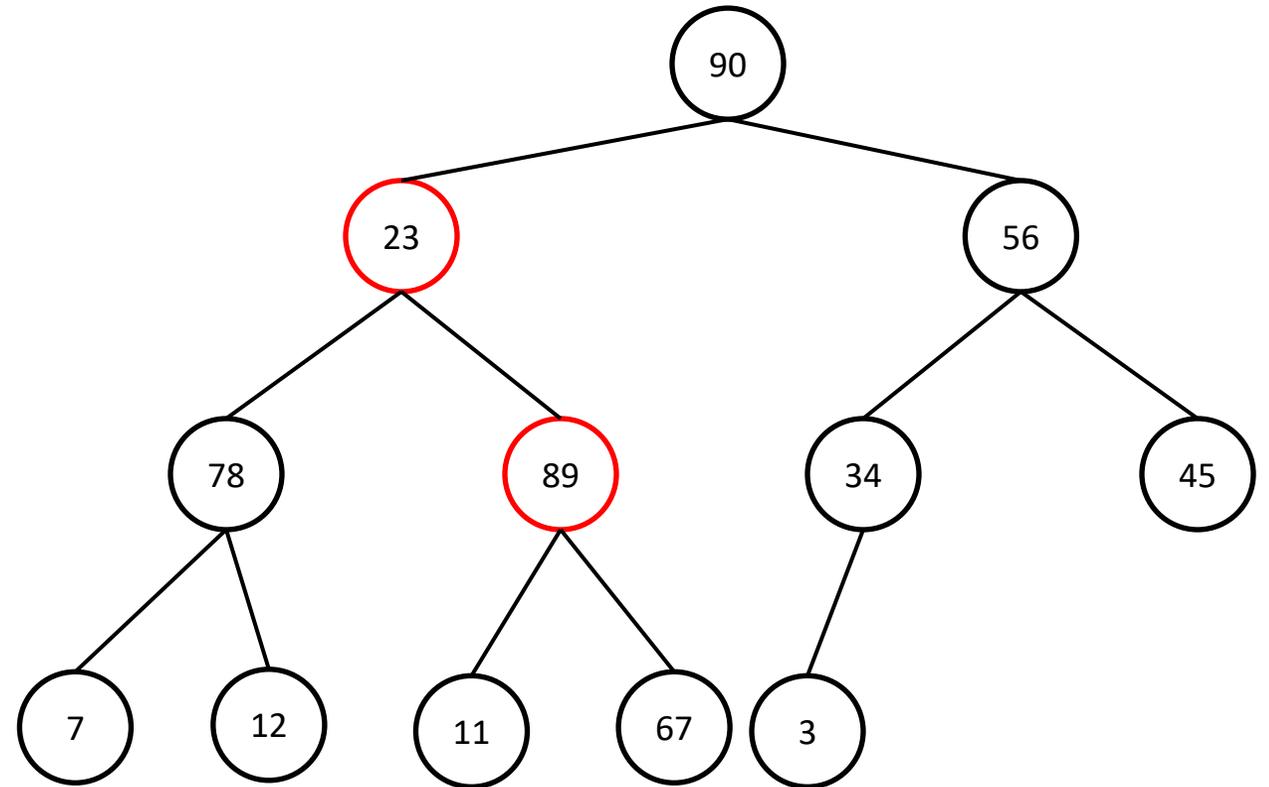
Heapify down 23 !

Heap Sort

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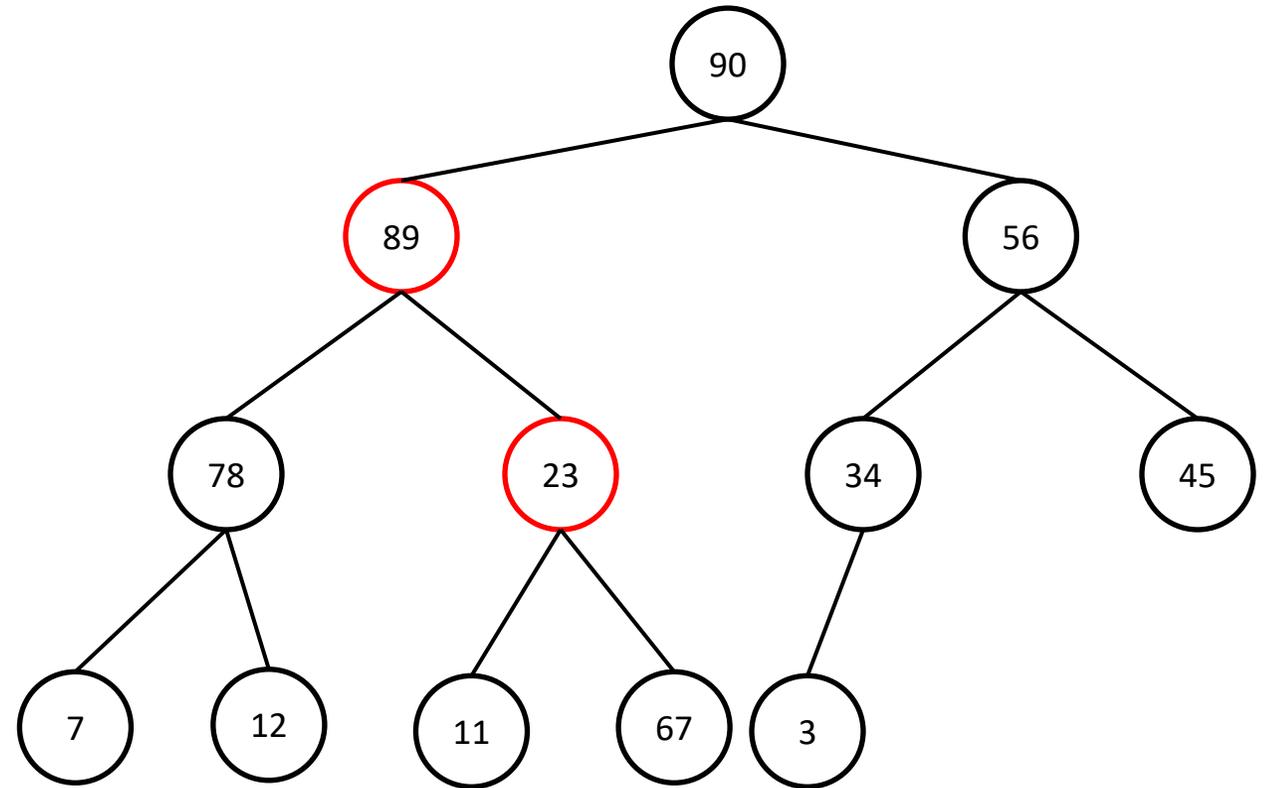
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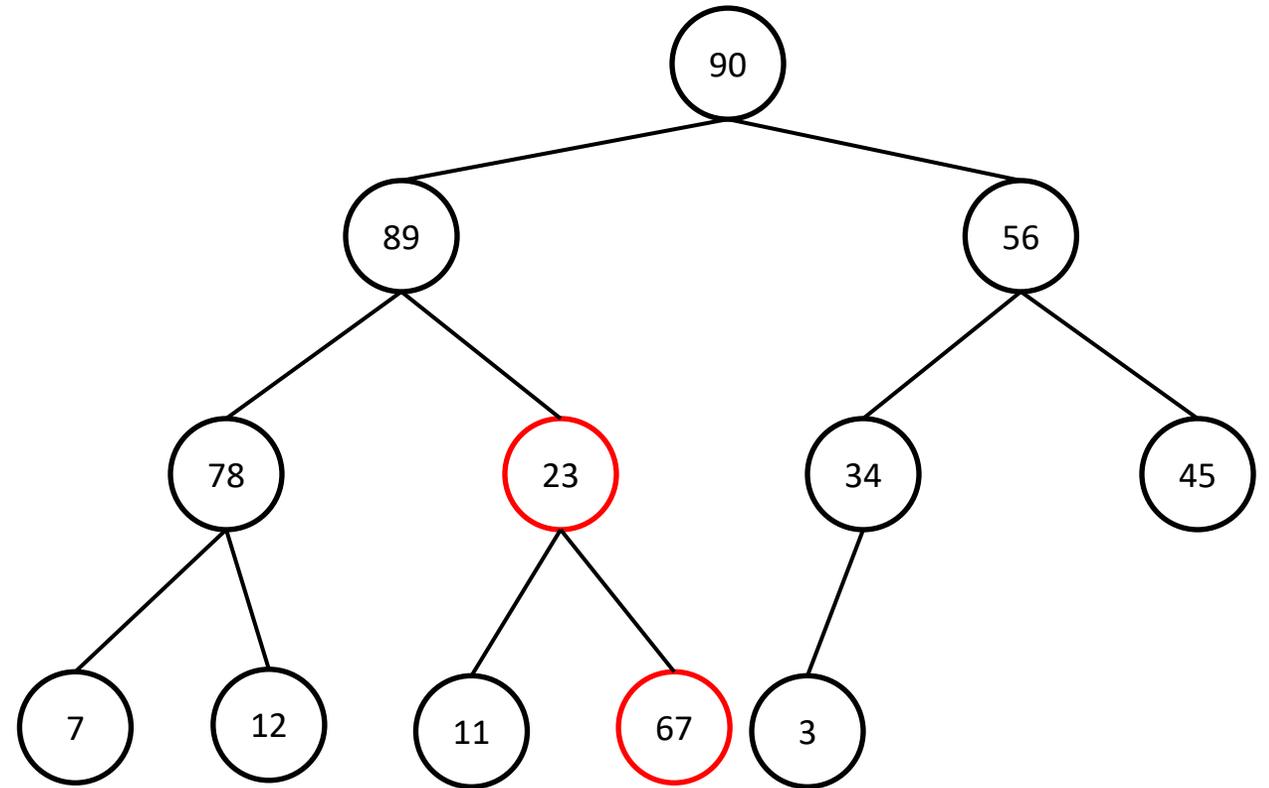
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Heap Sort

int[] data = {90, 89, 56, 78, 23, 34, 45, 7, 12, 11, 67, 3}

1. Build a **Max Heap** from the unsorted array

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Heapify down 23 !

Heap Sort

```
int[] data = {90, 89, 56, 78, 67, 34, 45, 7, 12, 11, 23, 3}
```

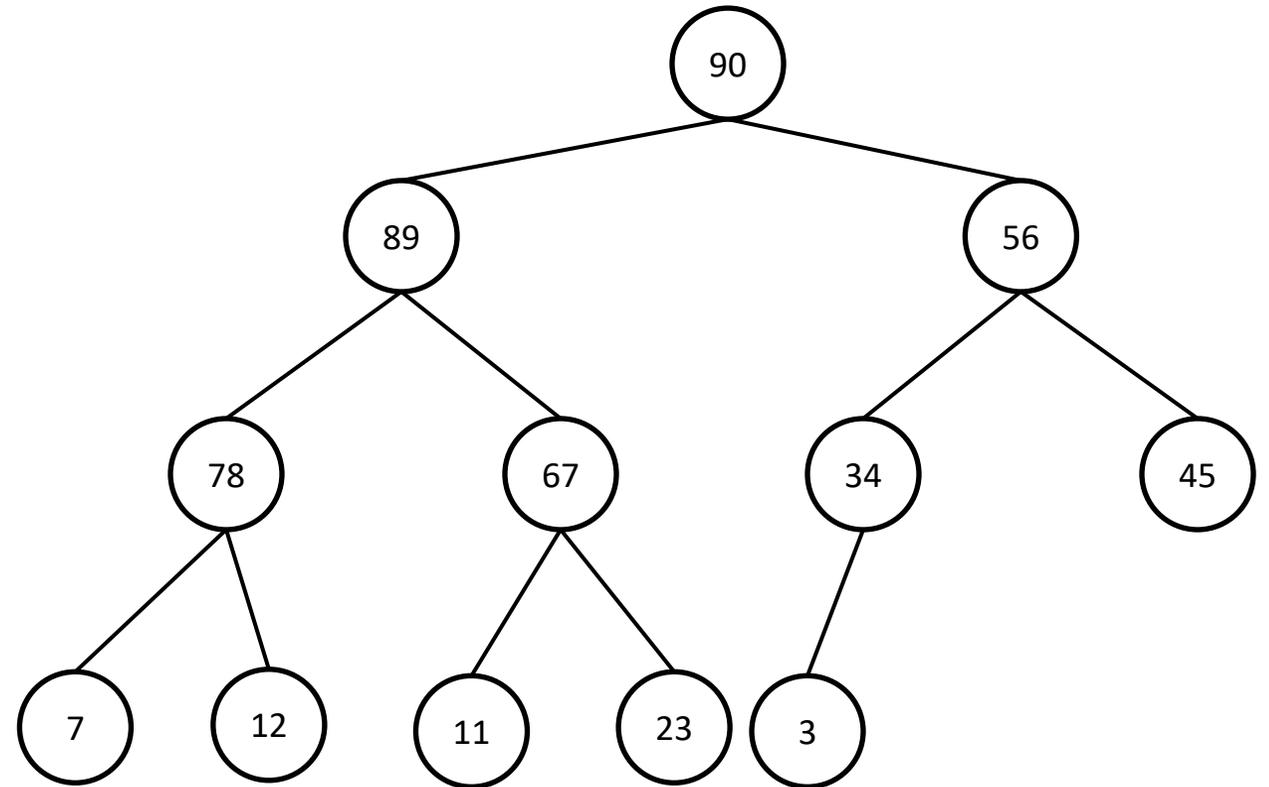
1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

for index i data.size to 0 : $O(n)$

heapifyDown(data.size, i) $O(\log n)$

Total for building heap: $O(n \log n)$



We now have a max heap

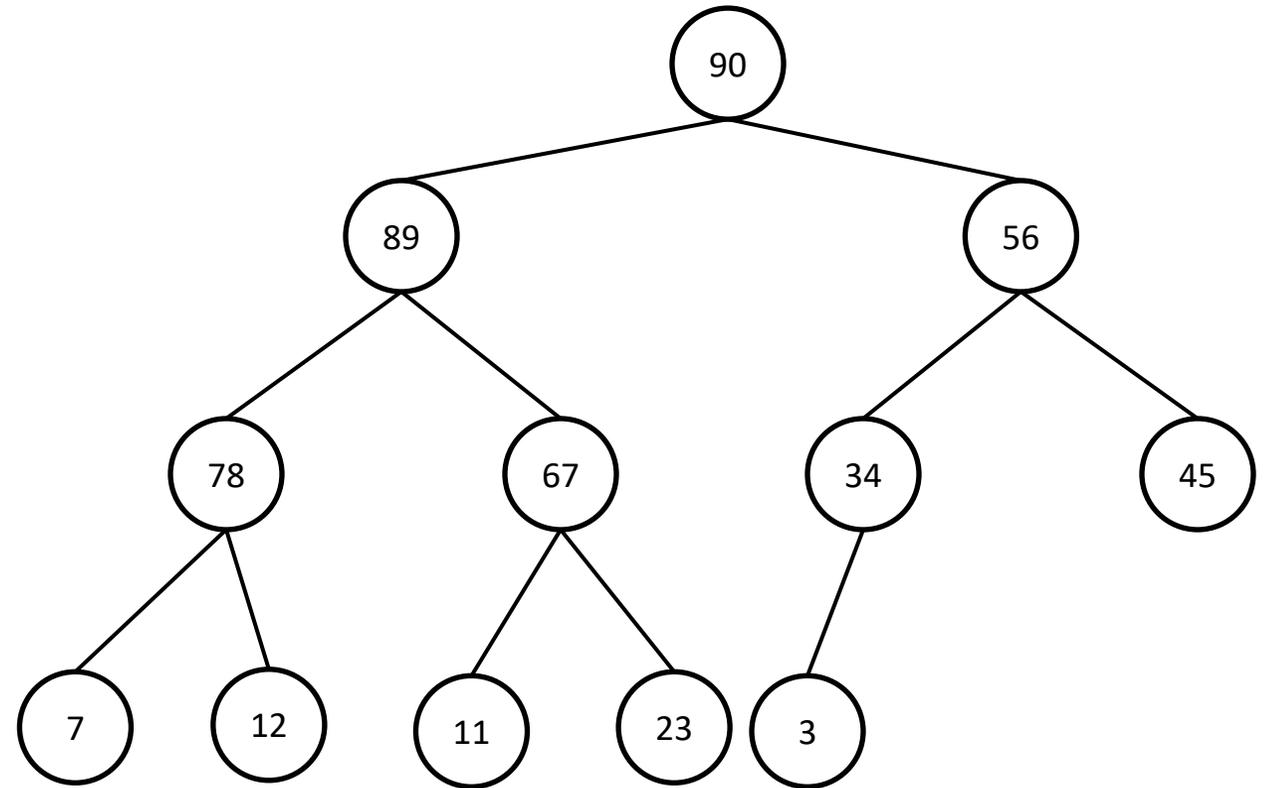
Heap Sort

`int[] data = {90, 89, 56, 78, 67, 34, 45, 7, 12, 11, 23, 3}`

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root



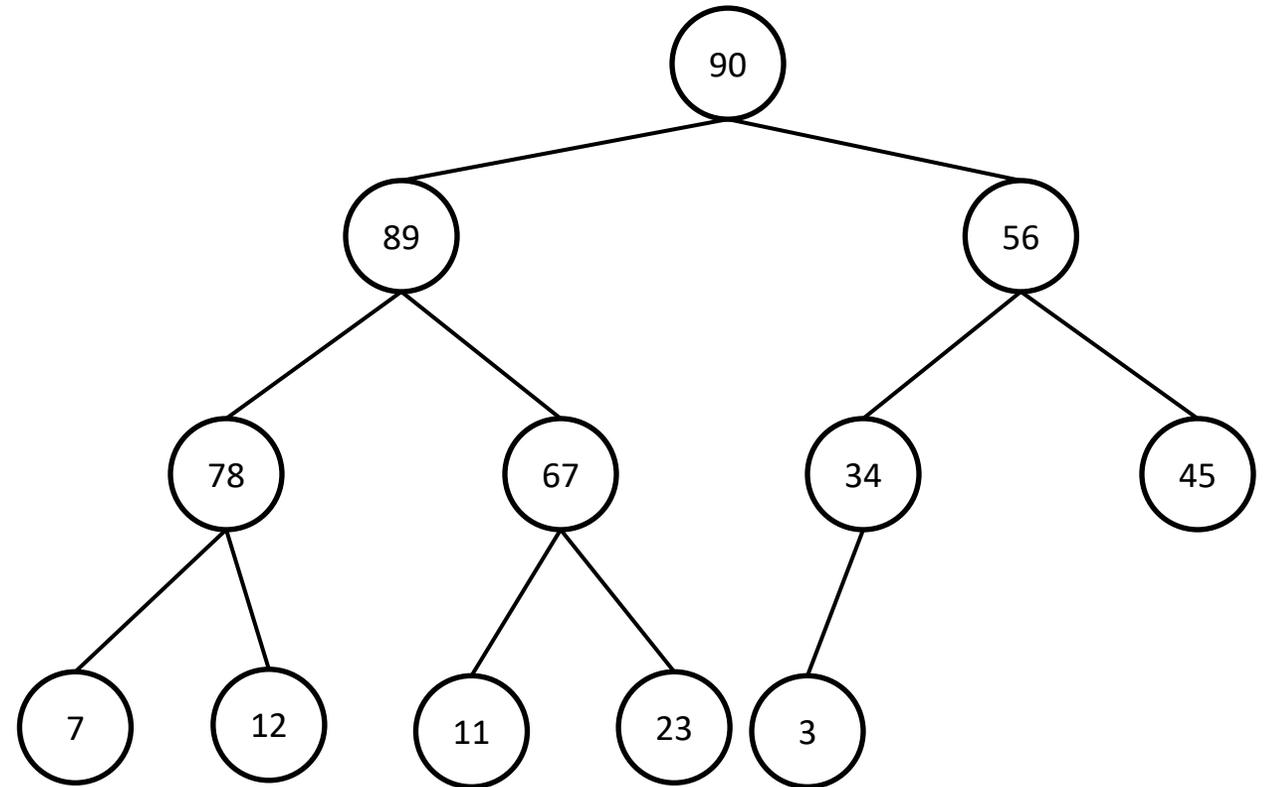
Heap Sort

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



90	89	56	78	67	34	45	7	12	11	23	3
----	----	----	----	----	----	----	---	----	----	----	---

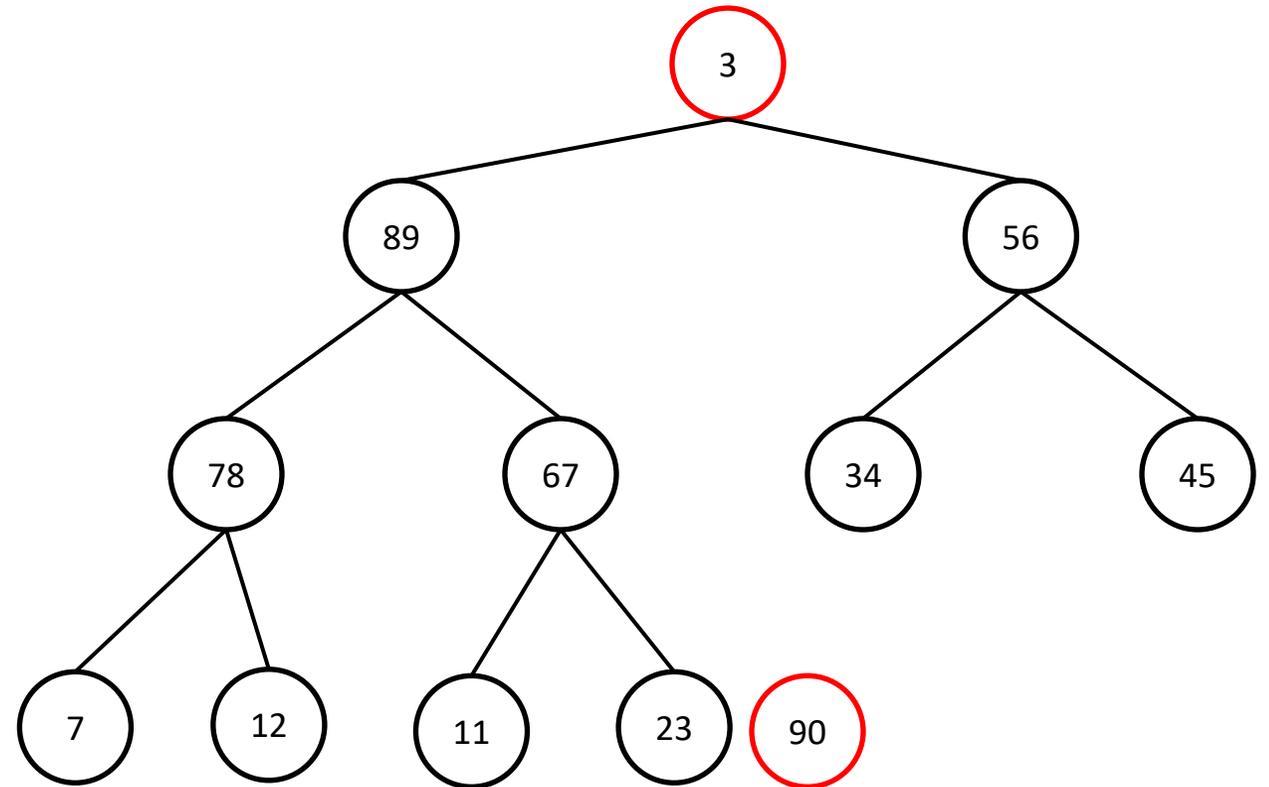
Heap Sort

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 3

3	89	56	78	67	34	45	7	12	11	23	90
---	----	----	----	----	----	----	---	----	----	----	----

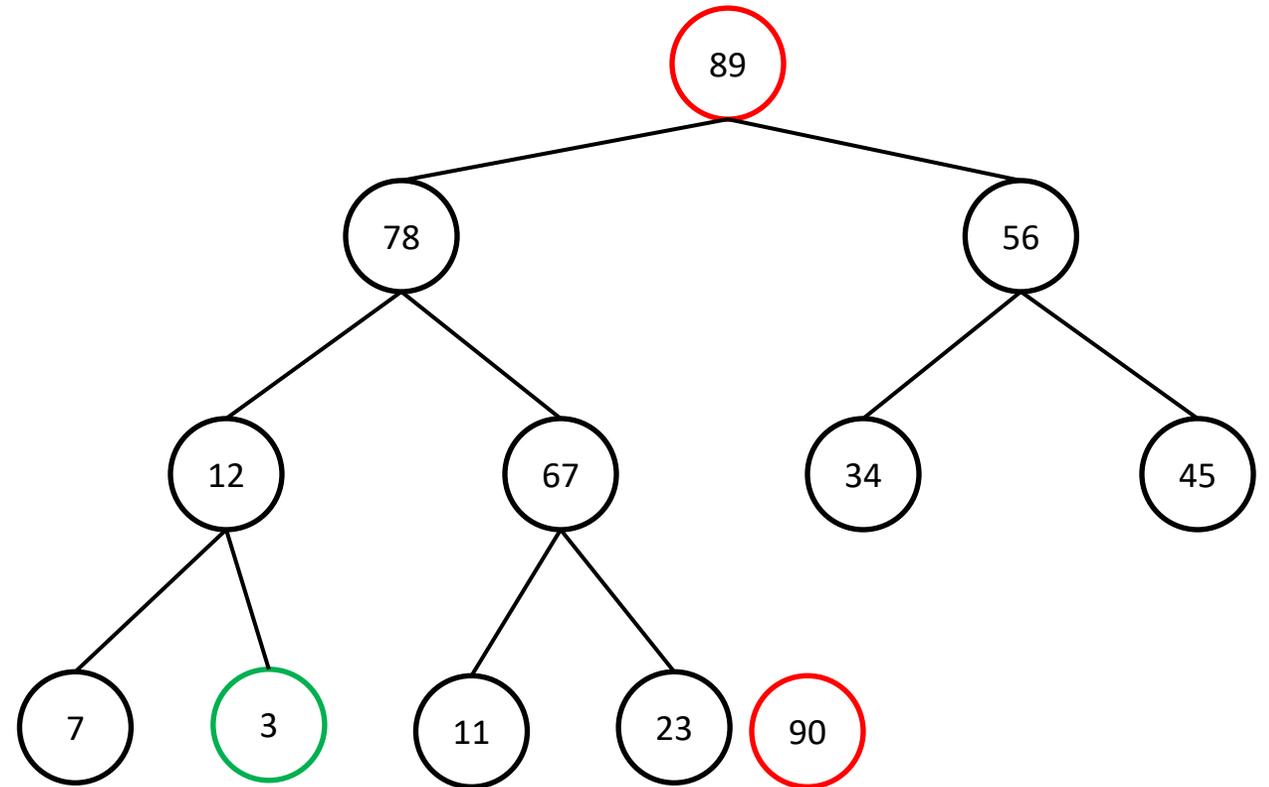
Heap Sort

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



We have one element in the correct spot. Now repeat N times (N = heap size)

89	78	56	12	67	34	45	7	3	11	23	90
----	----	----	----	----	----	----	---	---	----	----	----

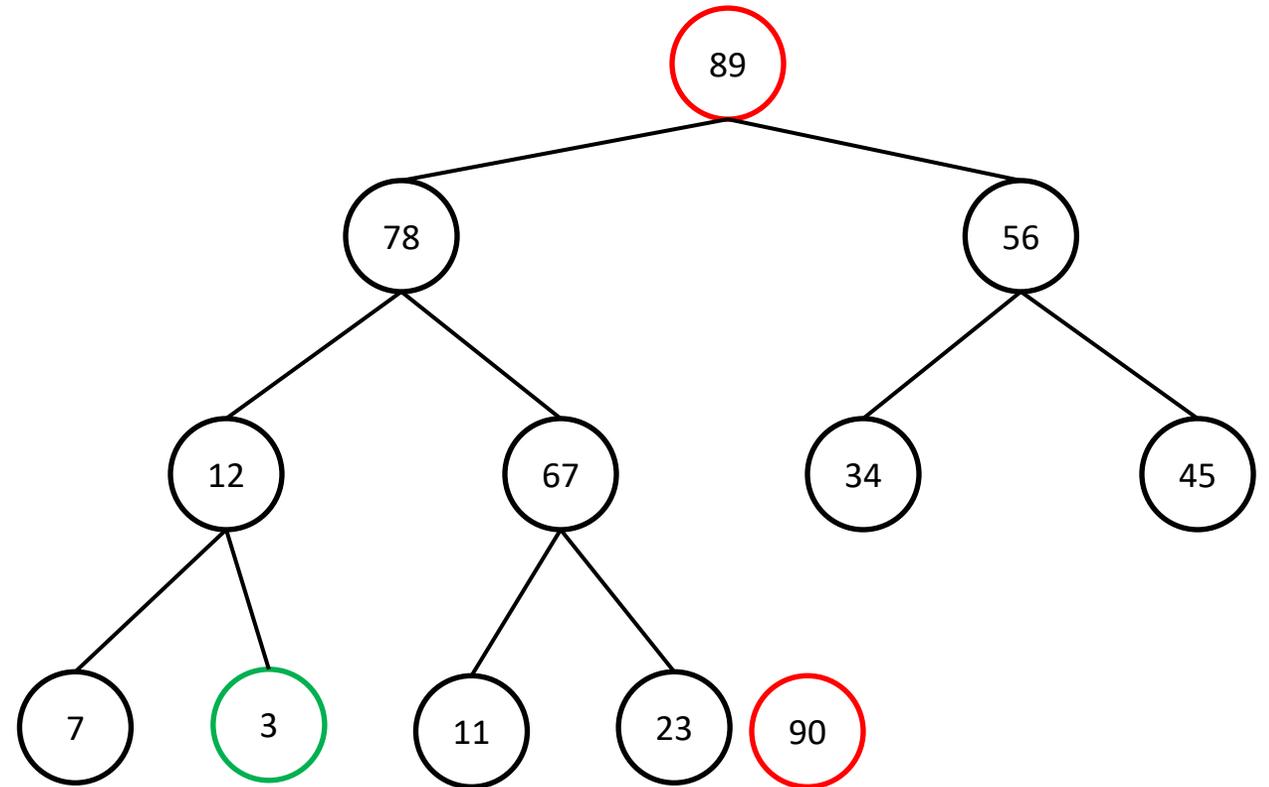
Heap Sort

1. Build a **Max Heap** from the unsorted array

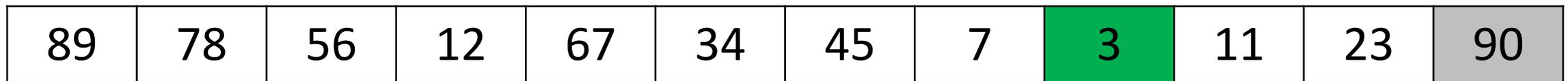
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



We don't want to “shrink” our array, but we need to change the bounds during Heapify Down



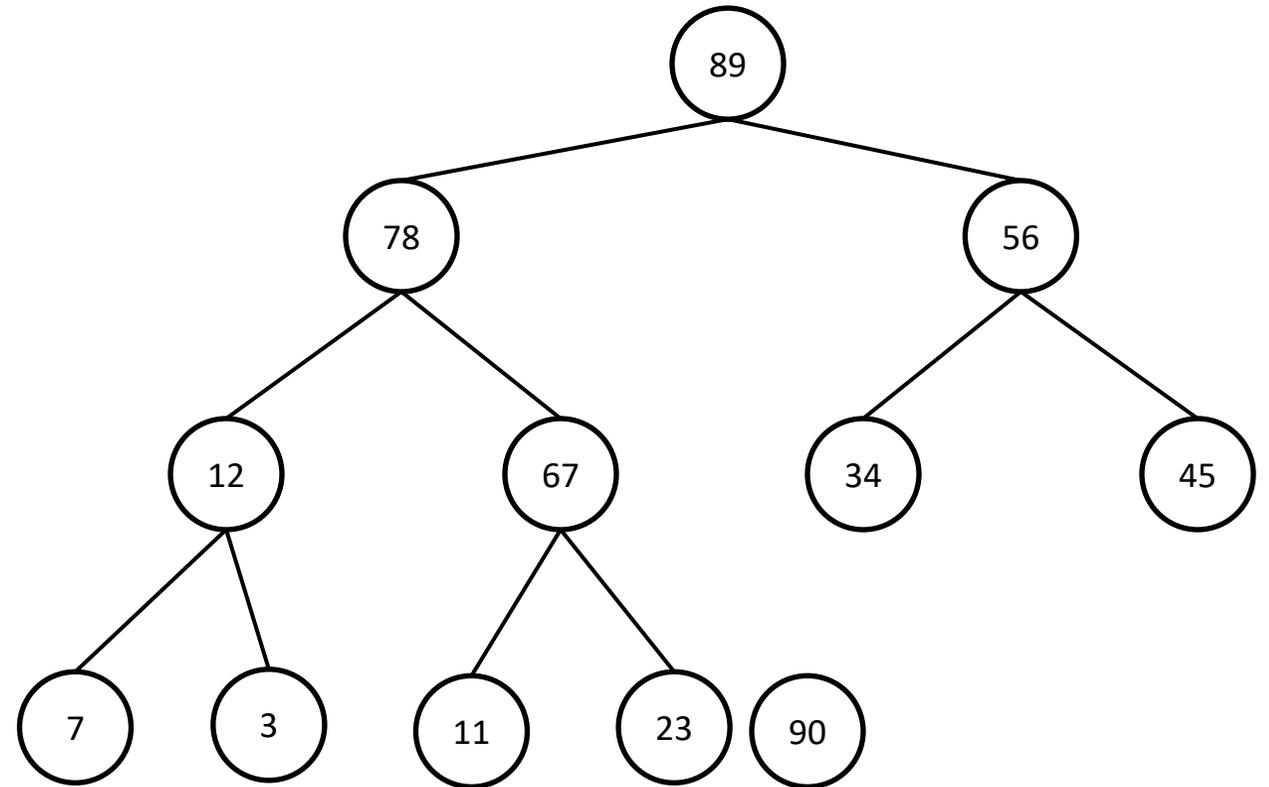
Heap Sort

1. Build a **Max Heap** from the unsorted array

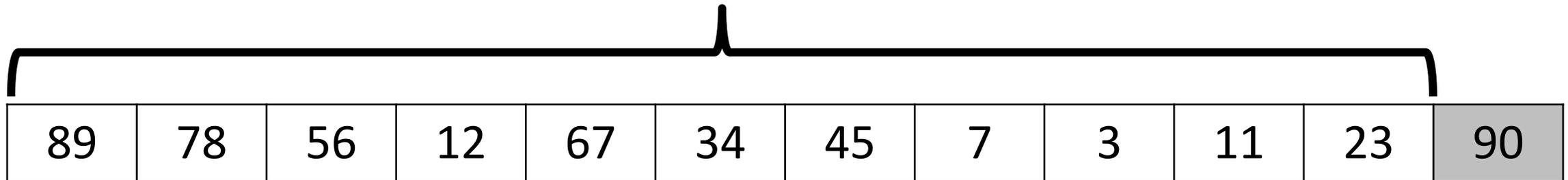
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



New bounds for Heapify Down



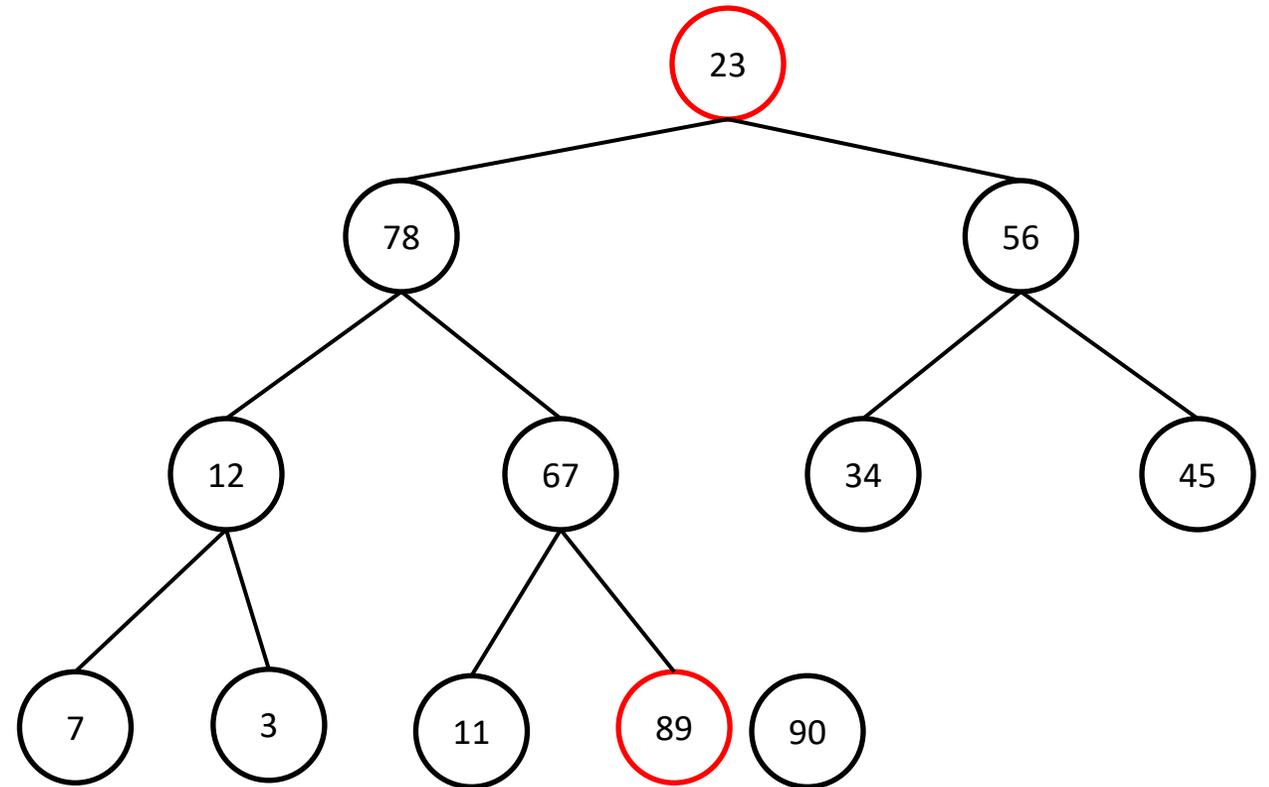
Heap Sort

1. Build a **Max Heap** from the unsorted array

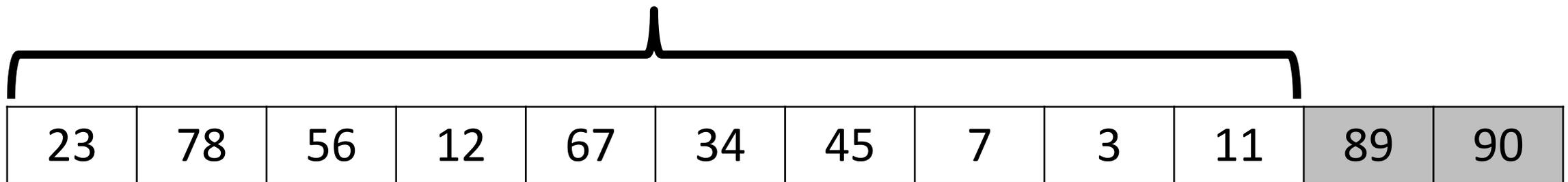
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



New bounds for Heapify Down



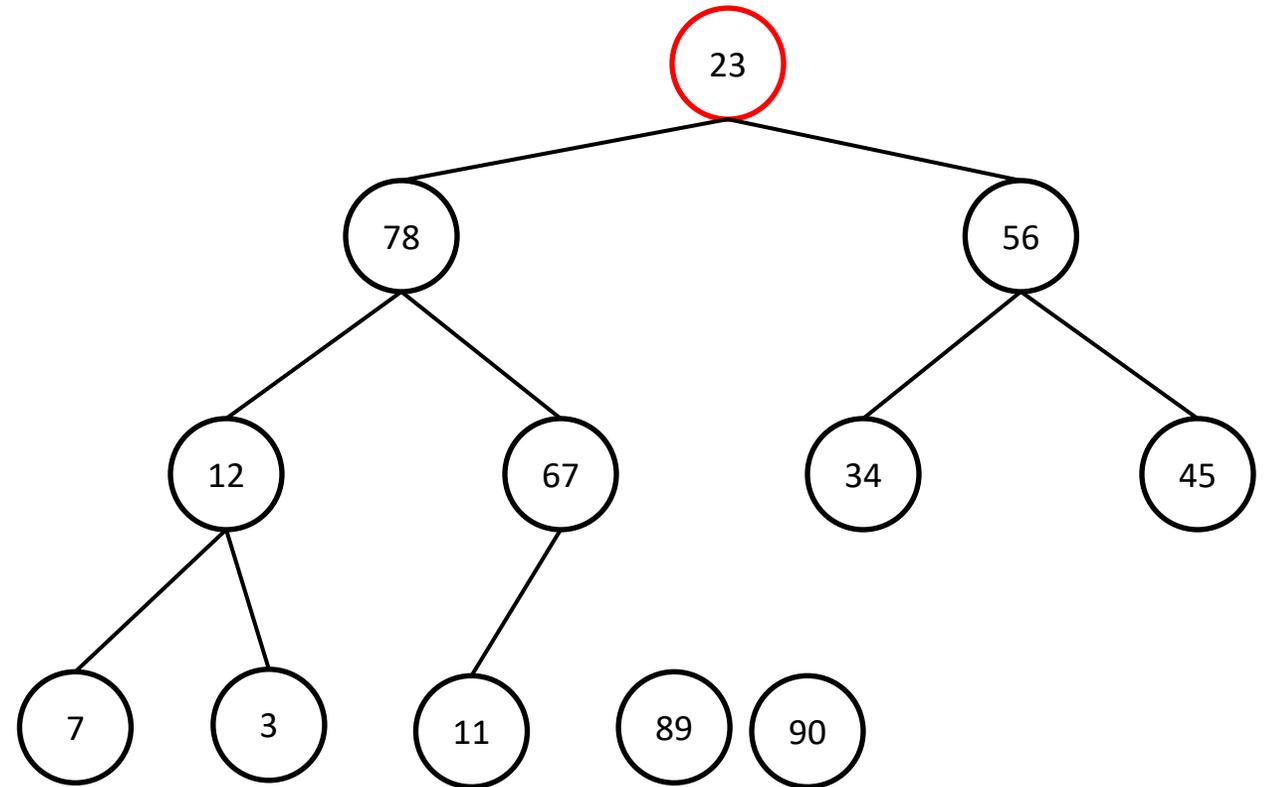
Heap Sort

1. Build a **Max Heap** from the unsorted array

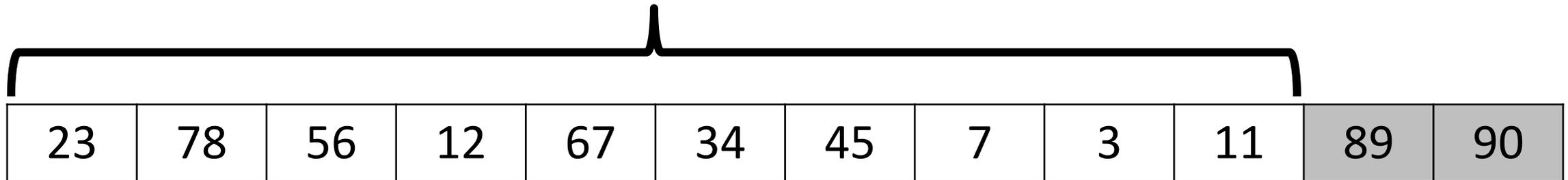
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 23



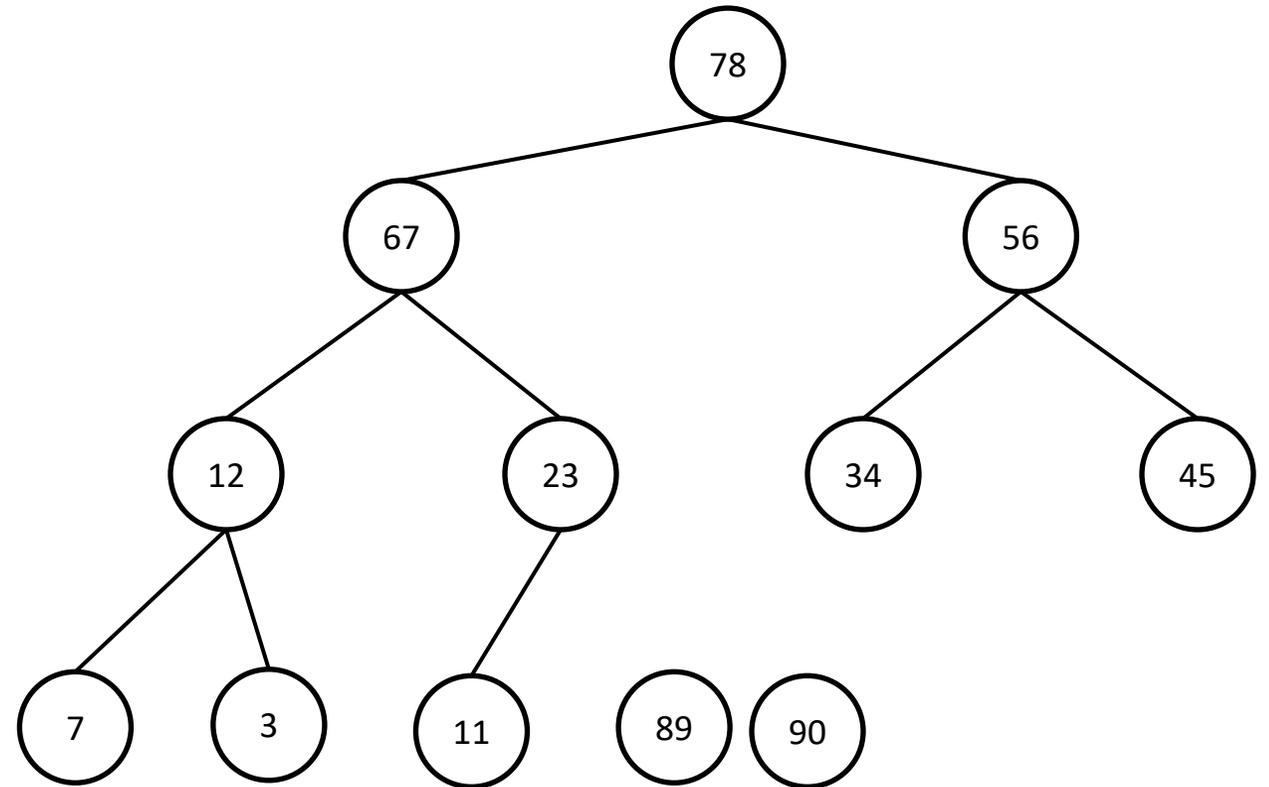
Heap Sort

1. Build a **Max Heap** from the unsorted array

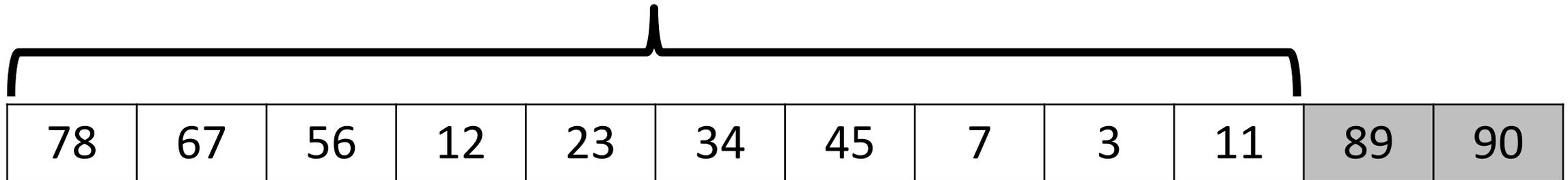
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 23



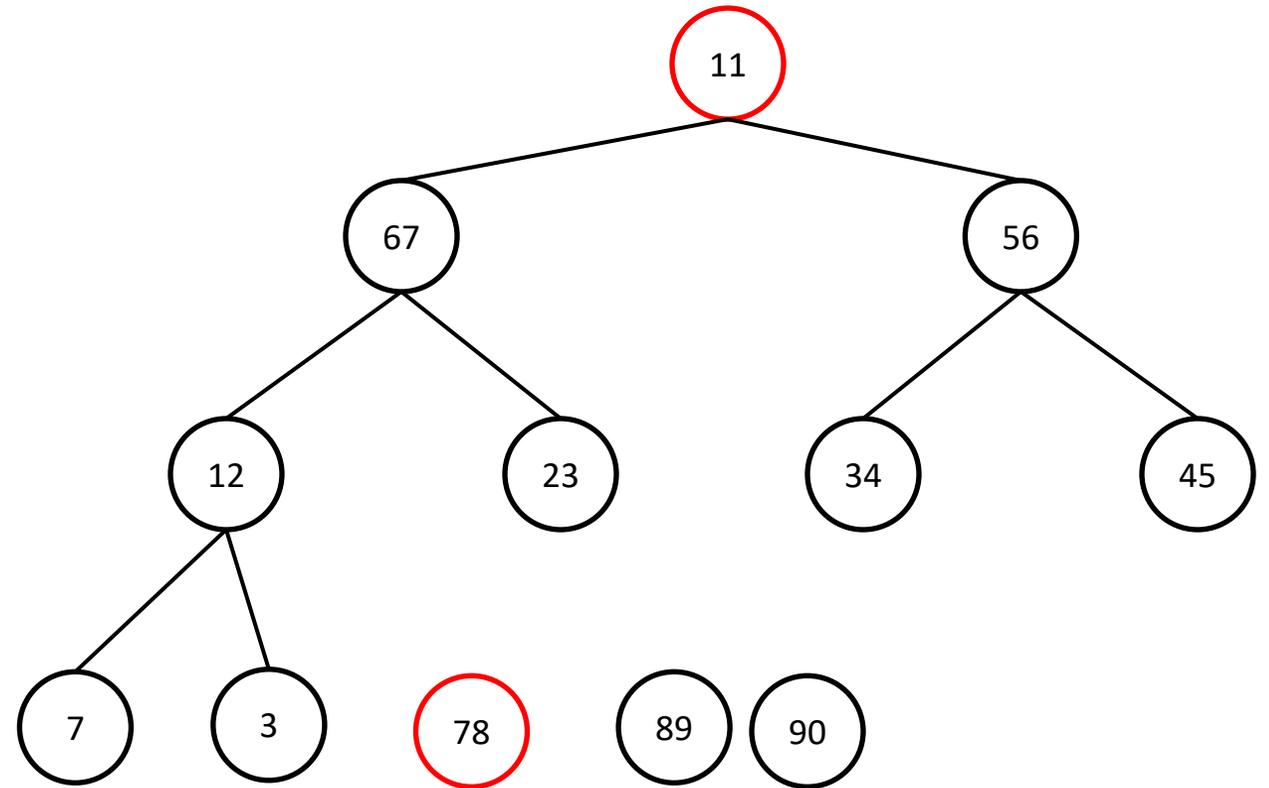
Heap Sort

1. Build a **Max Heap** from the unsorted array

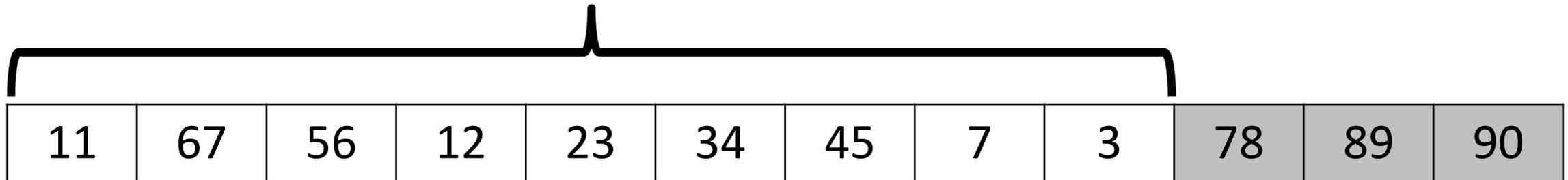
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 11



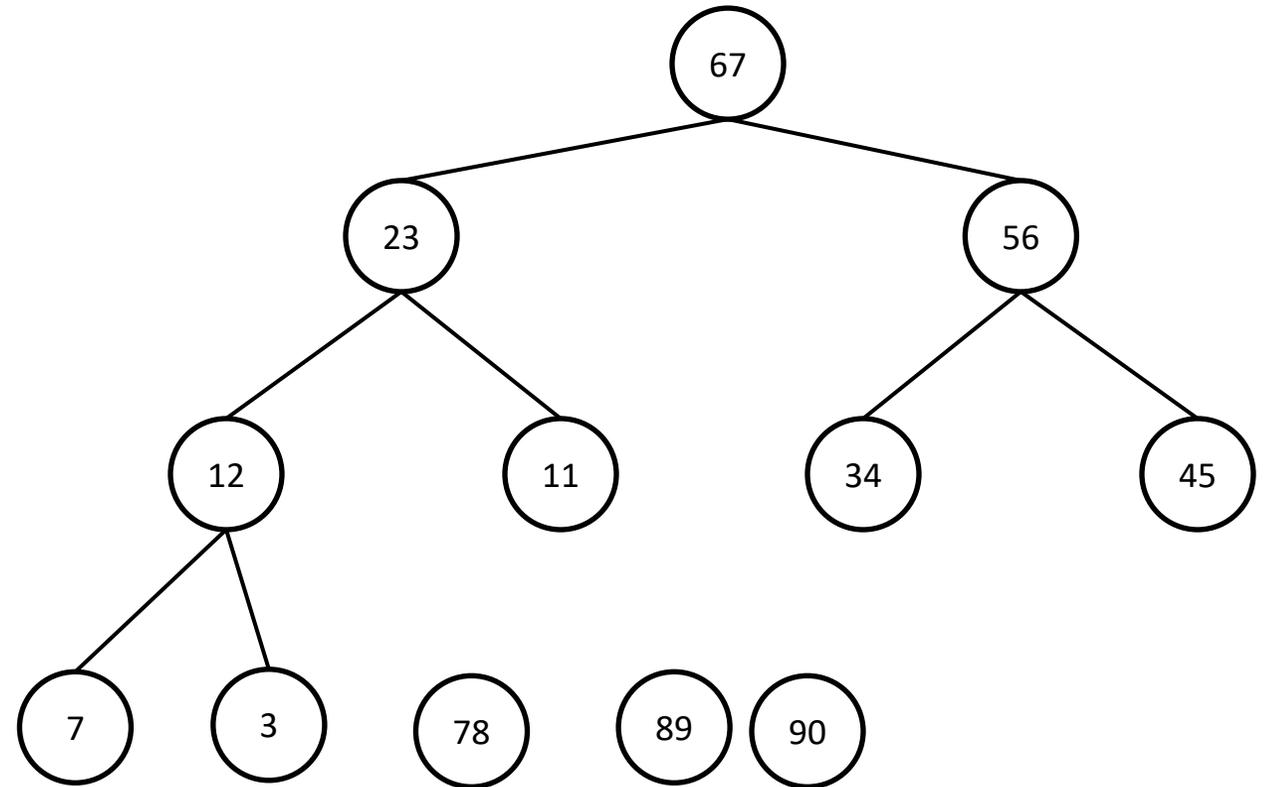
Heap Sort

1. Build a **Max Heap** from the unsorted array

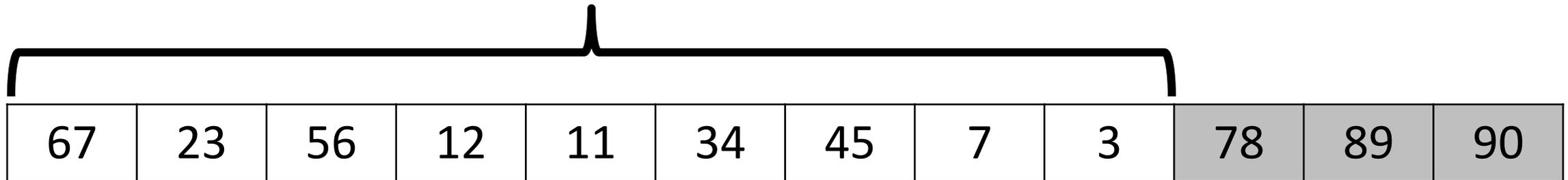
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 11



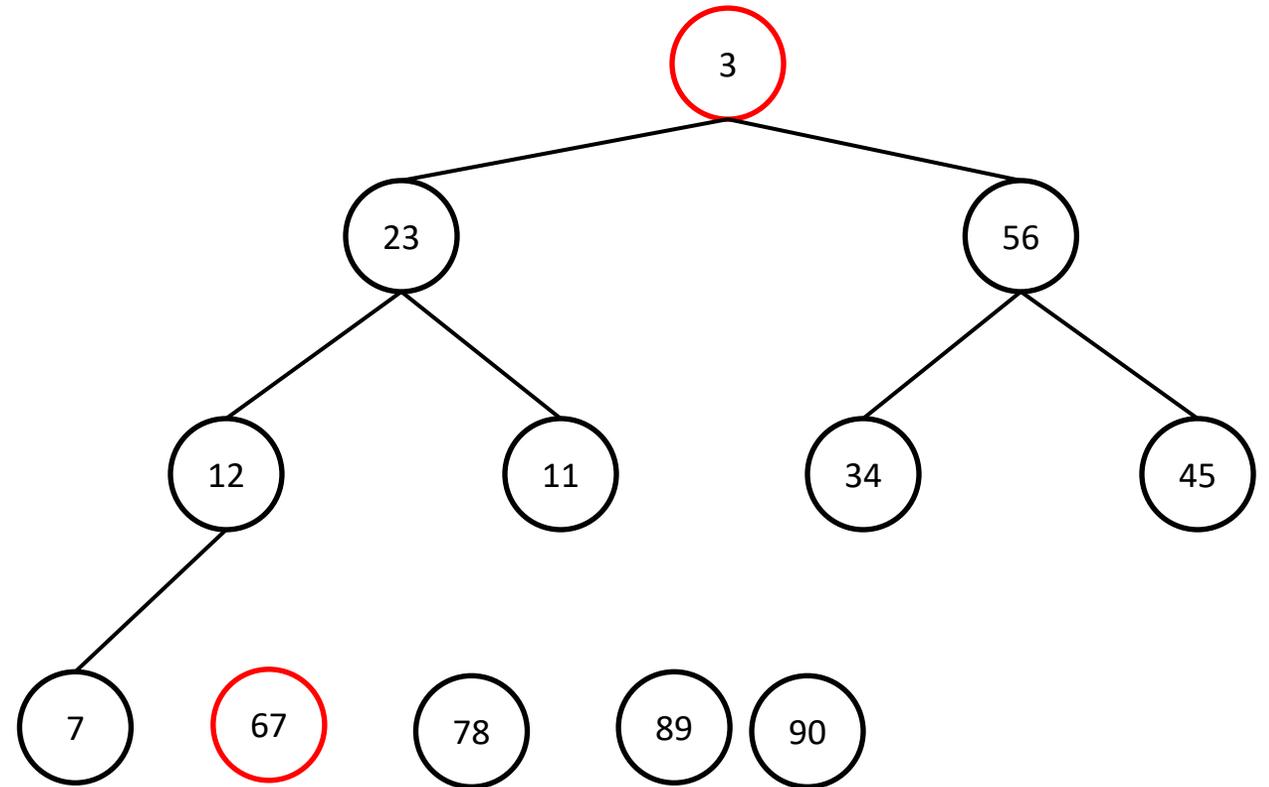
Heap Sort

1. Build a **Max Heap** from the unsorted array

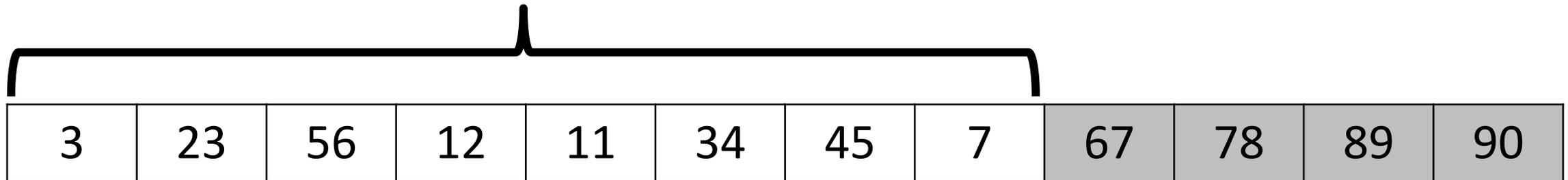
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 3



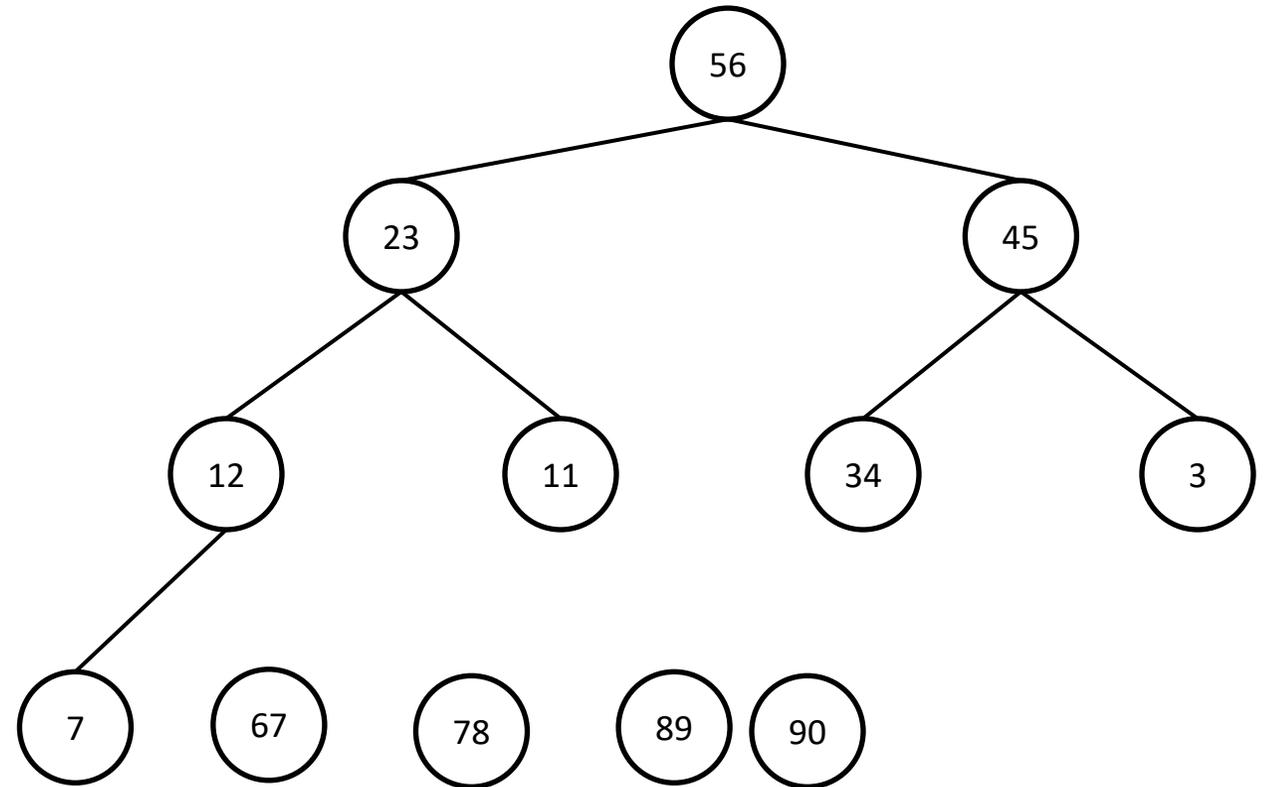
Heap Sort

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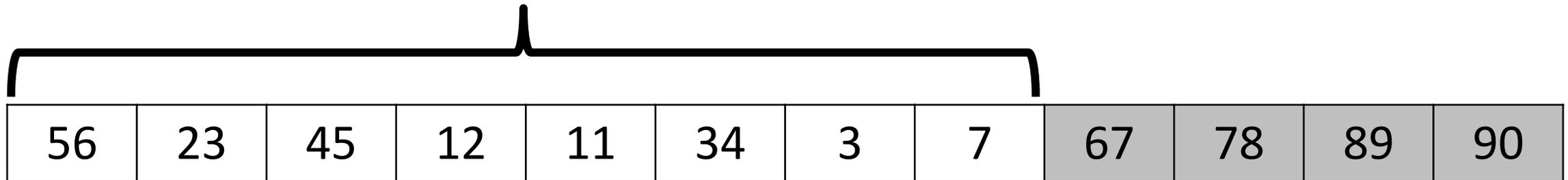
Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



Heapify Down 3



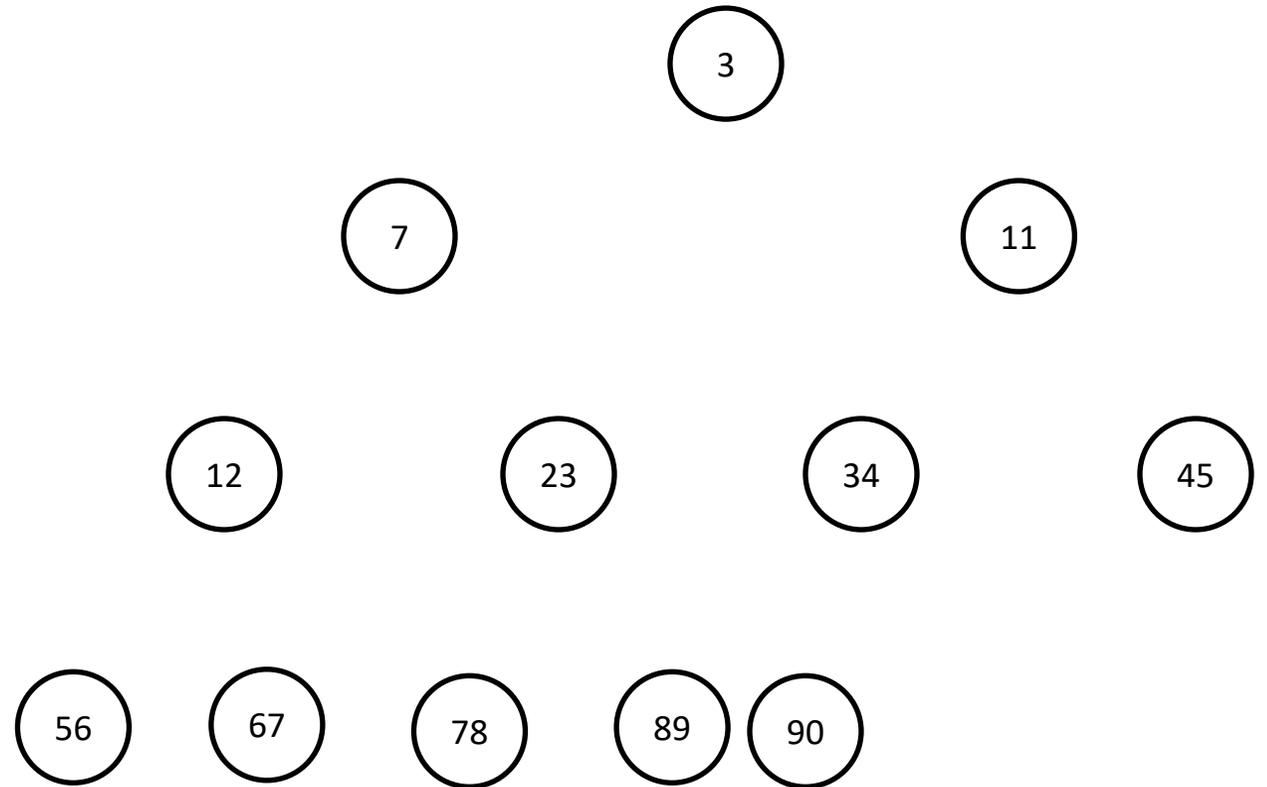
Heap Sort

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times



(Fast forward...)

3	7	11	12	23	34	45	56	67	78	89	90
---	---	----	----	----	----	----	----	----	----	----	----

Heap Sort

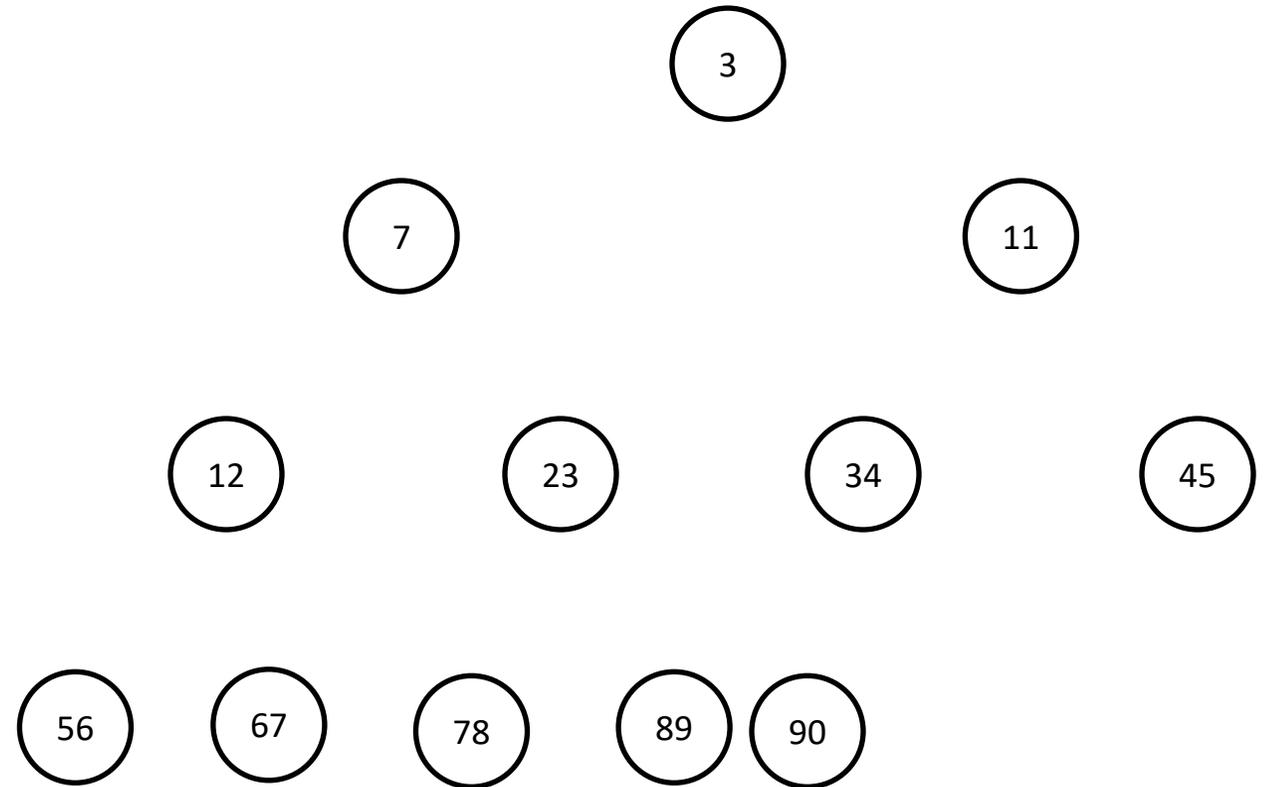
1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

2. Swap the root with last element, and heapify down the new root

Repeat N amount of times $O(n)$

“Sorting” step = $O(n \log n)$



3	7	11	12	23	34	45	56	67	78	89	90
---	---	----	----	----	----	----	----	----	----	----	----

Heap Sort

1. Build a **Max Heap** from the unsorted array

Work through the array backwards, and swap a node with a child if its larger

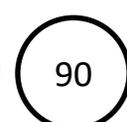
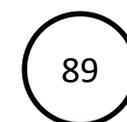
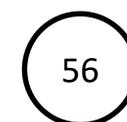
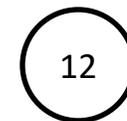
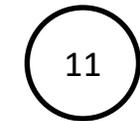
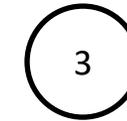
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Repeat N amount of times

$O(n \log n) + O(n \log n)$

$\in O(n \log n)$

3	7	11	12	23	34	45	56	67	78	89	90
---	---	----	----	----	----	----	----	----	----	----	----



Heap Sort

<https://www.youtube.com/watch?v=iXAjiDQbPSw>