



## Lesson 2 Objectives:

To gain an understanding of:

1. What are **priority queues** and how we may efficiently implement them
2. What are and why we need the **heap (binary heap)** data structure
3. How to **analyse and implement** heaps
4. How to implement heaps with **changing keys**

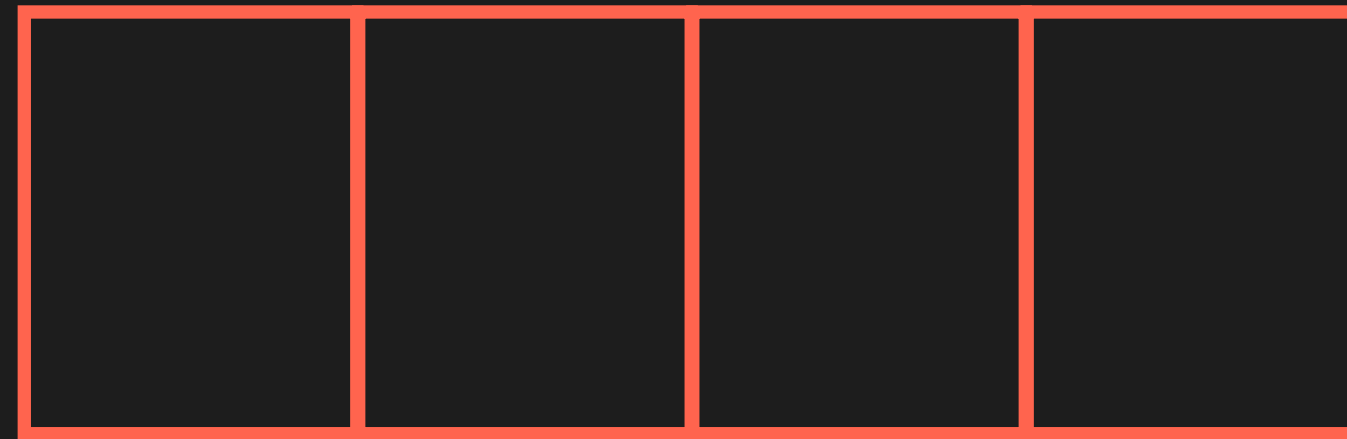
# Recap: Queues

# Queues

Queues are **FIRST IN FIRST OUT**

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# Queues

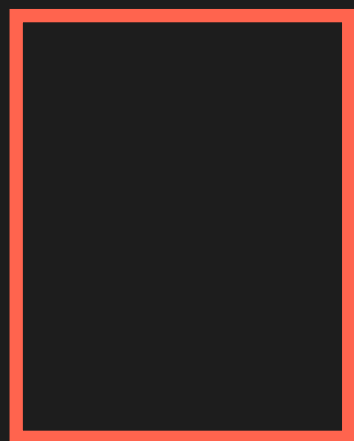
Queues are **FIRST IN FIRST OUT**



insert

# Queues

Queues are **FIRST IN FIRST OUT**



remove

Stock	Estimated Returns
Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

**Imagine we had the following list of company stocks and their estimated returns on investment (higher is better)**



# Can we simulate the following behavior?

**Front**

**Back**

Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

**The front of the queue should always be the stock with highest return**

# Can we simulate the following behavior?

**Front**

**Google**

**Back**

Google	30%
Amazon	20%
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**The front of the queue should always be the stock with highest return**

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**Front**

Google	Amazon
--------	--------

**Back**

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**The front of the queue should always be the stock with highest return**

# Can we simulate the following behavior?

**Front**

Apple	Google	Amazon
-------	--------	--------

**Back**

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Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

**The front of the queue should always be the stock with highest return**

# Can we simulate the following behavior?

**Front**

Apple	Microsoft	Google	Amazon
-------	-----------	--------	--------

**Back**

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Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

**The front of the queue should always be the stock with highest return**

# Can we simulate the following behavior?

**Front**

Apple	Microsoft	Google	Netflix	Amazon
-------	-----------	--------	---------	--------

**Back**

Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

**The front of the queue should always be the stock with highest return**

This is called a **Priority Queue**. We created a queue of stocks with the priority being its returns. How can we create such a structure?

# Method 1: **Linked Lists**



## Method 1: **Linked Lists**

**Insertion:** To insert into a PQ linked list, we can simply insert at the front. This takes  $O(1)$  time

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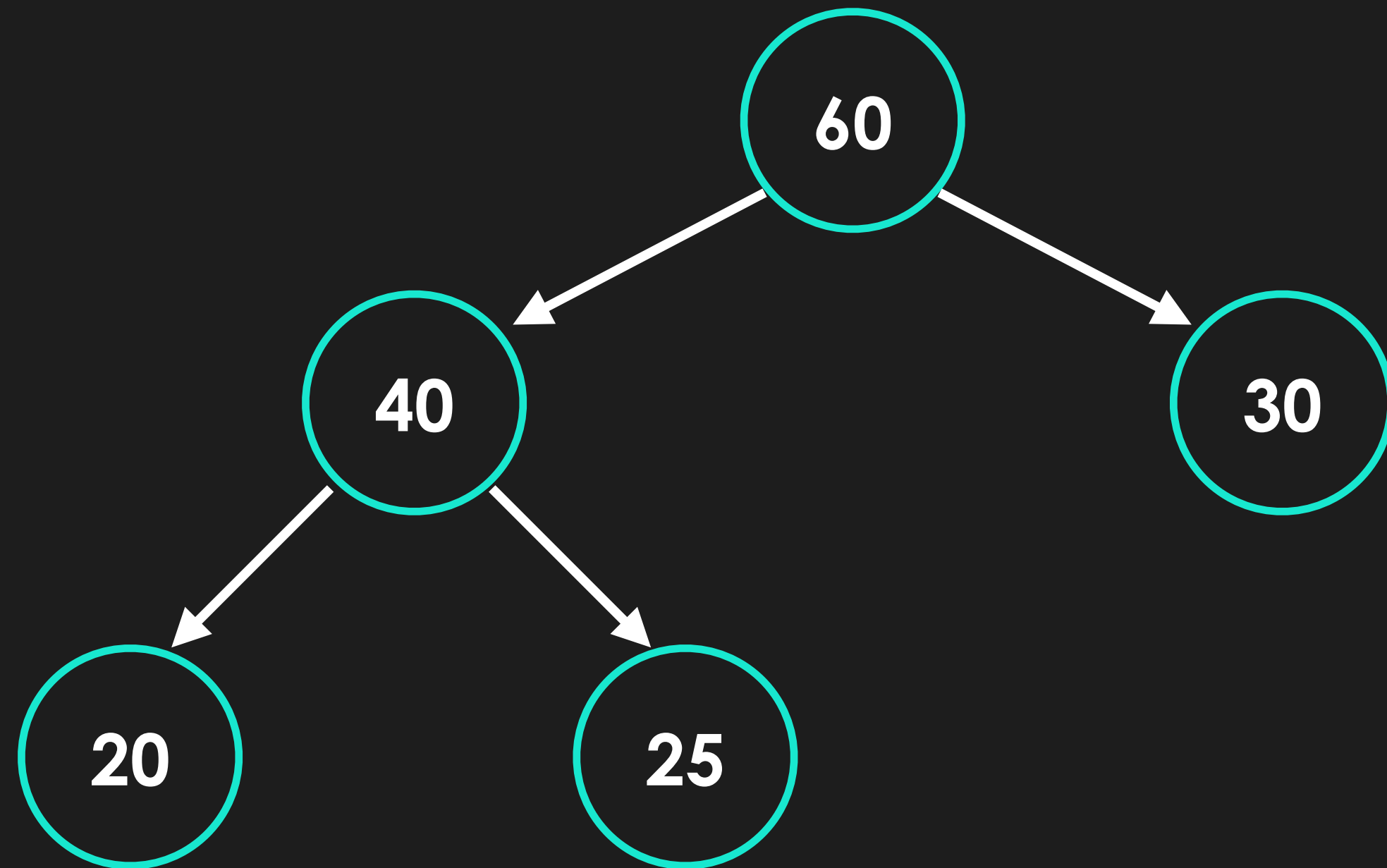
**GetMax:** To remove the item with highest priority at any time, traverse the list to find the max item using linear search, and remove. This takes  $O(N)$  time

# Method 2: Binary Heaps

## Method 2: **Binary Heaps**

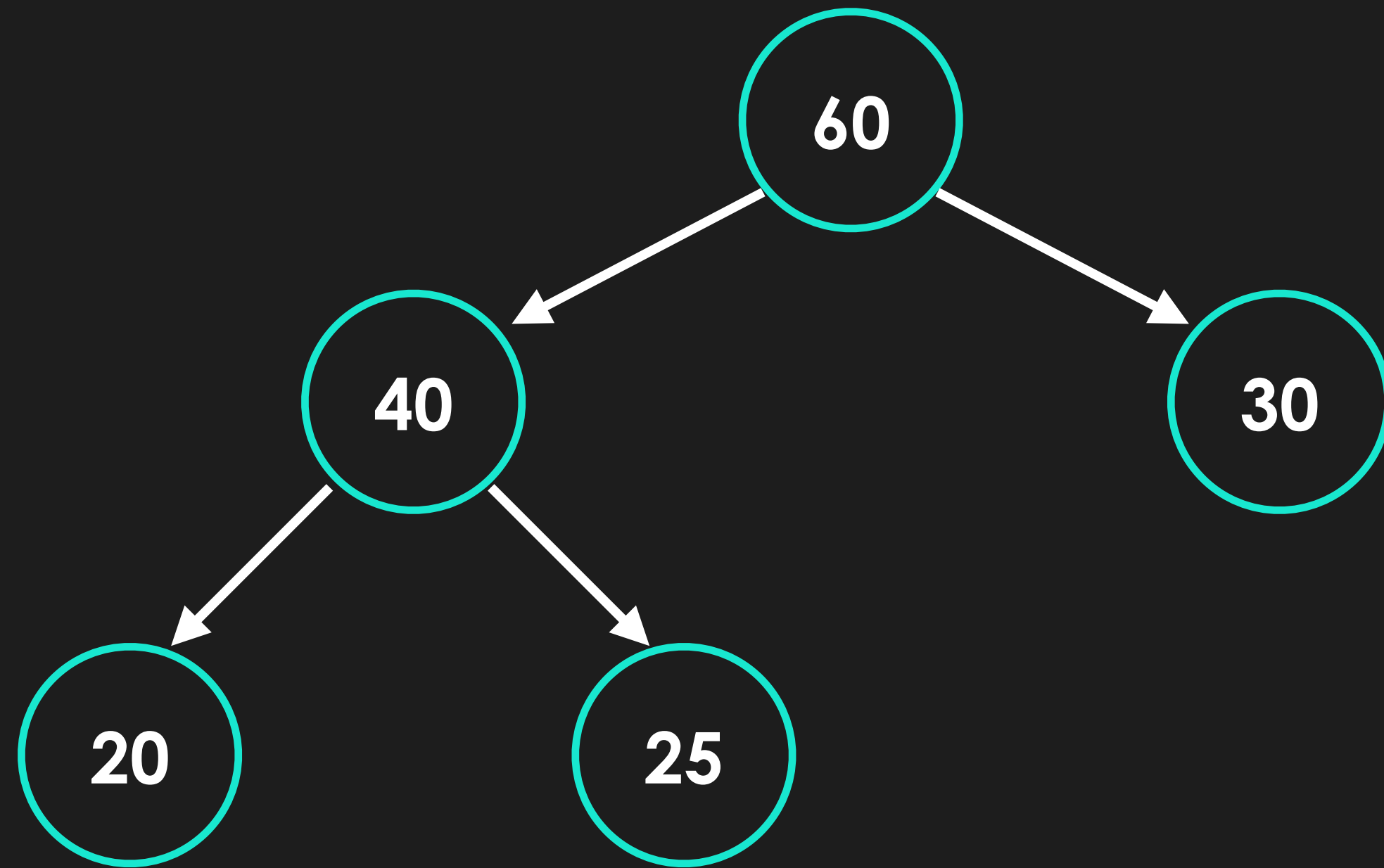
Binary Heaps make use of the binary tree structure to implement the priority queue logic

# Binary Heap



Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

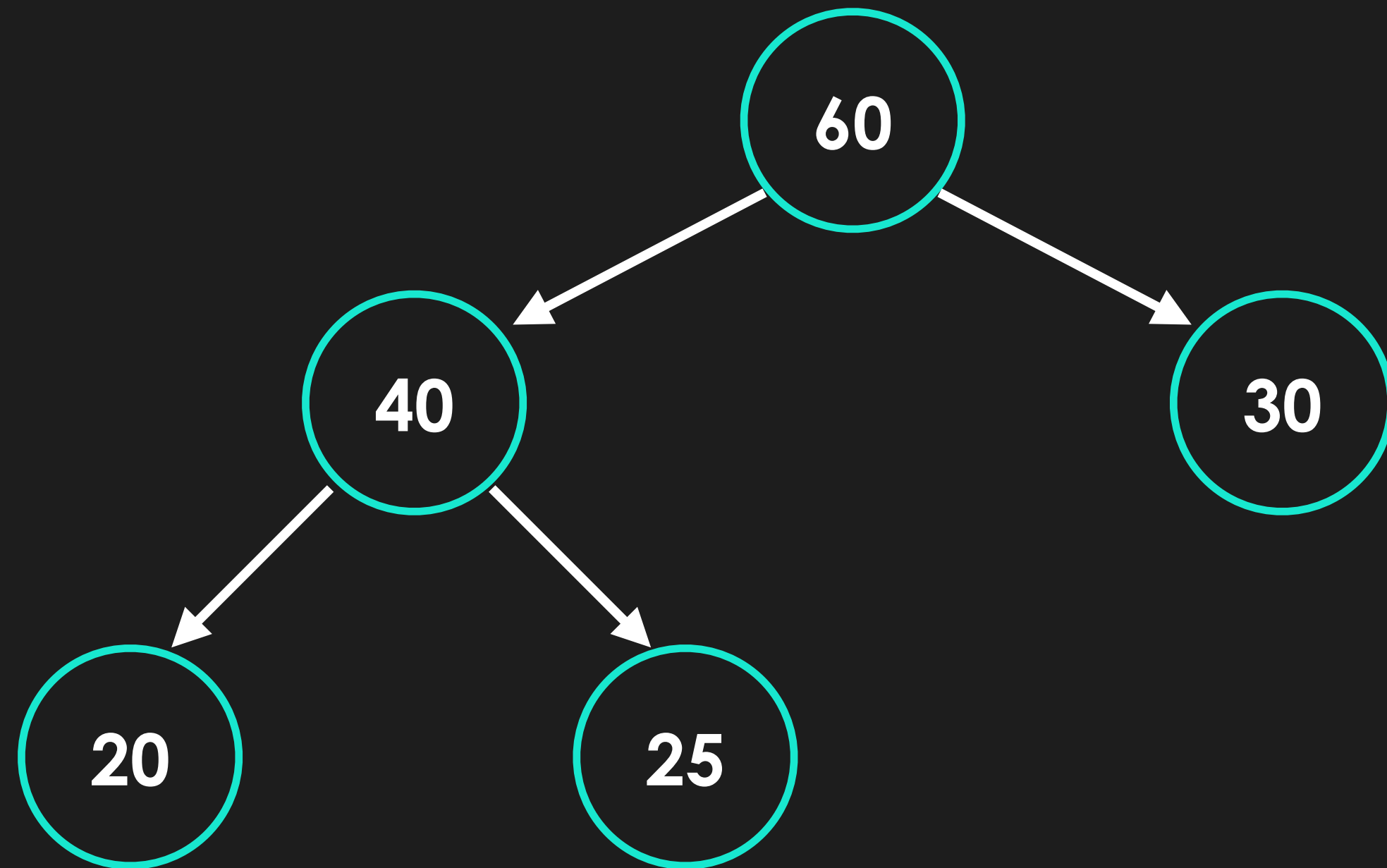
# Binary Heap



Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

We will represent each node as it's **priority** (return)

# Binary Heap

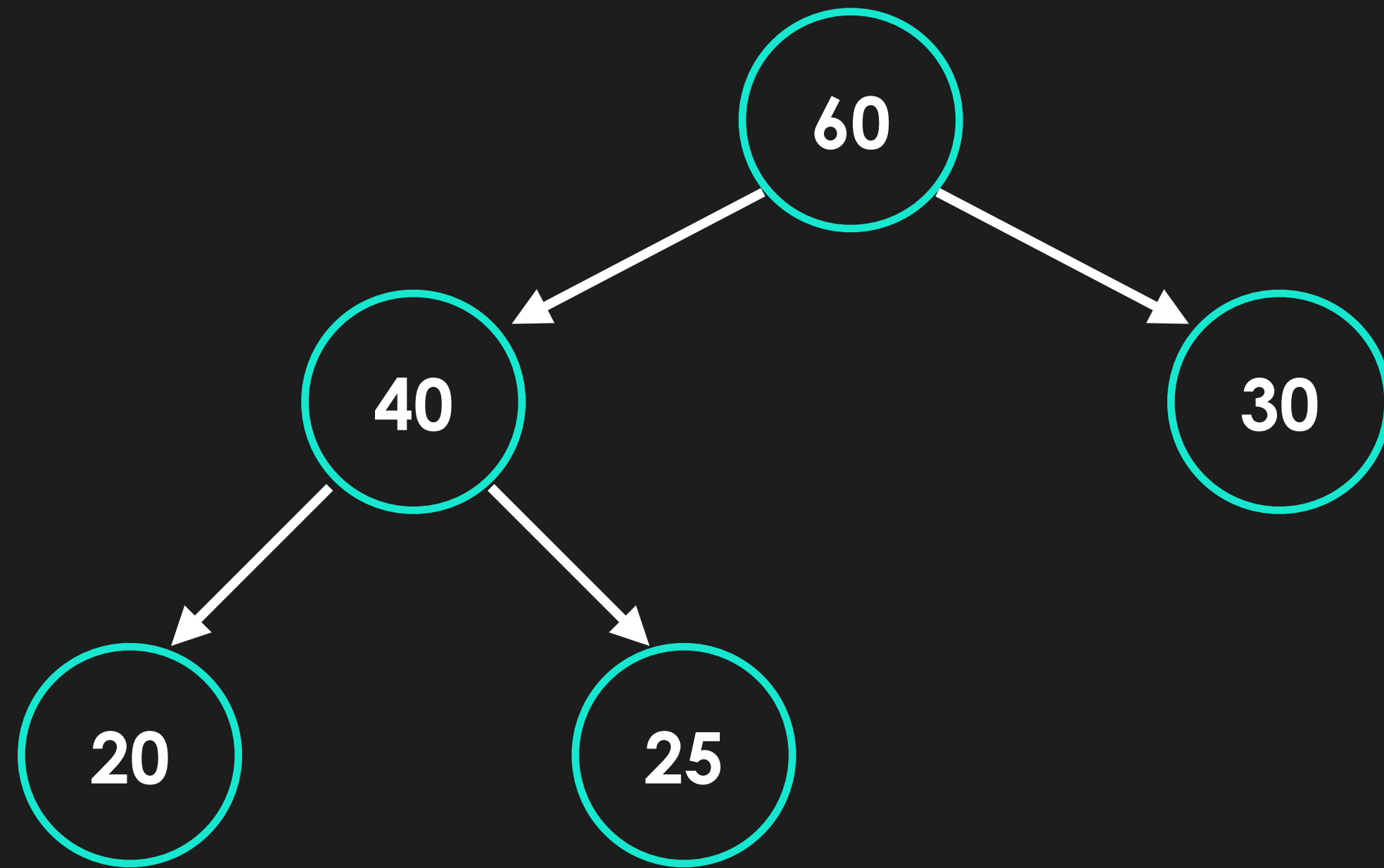


Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

## Rules for Binary Heap:

1. Root node must be entry with max priority
2. For each node, every child node below must have lower priority

# Binary Heap

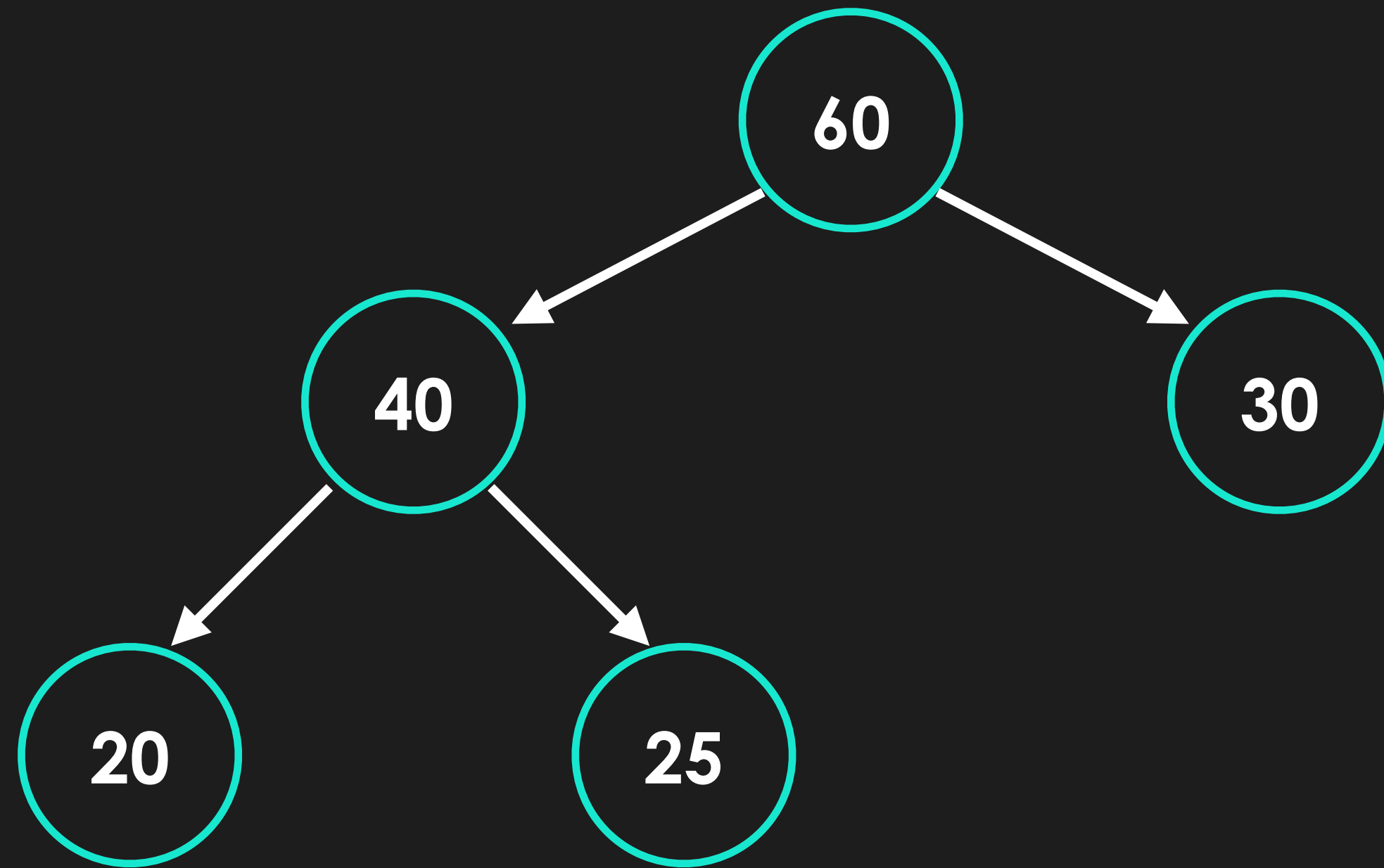


Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%

The above is also called a **max heap** because the priority is given to returns of **higher value**



# Binary Heap



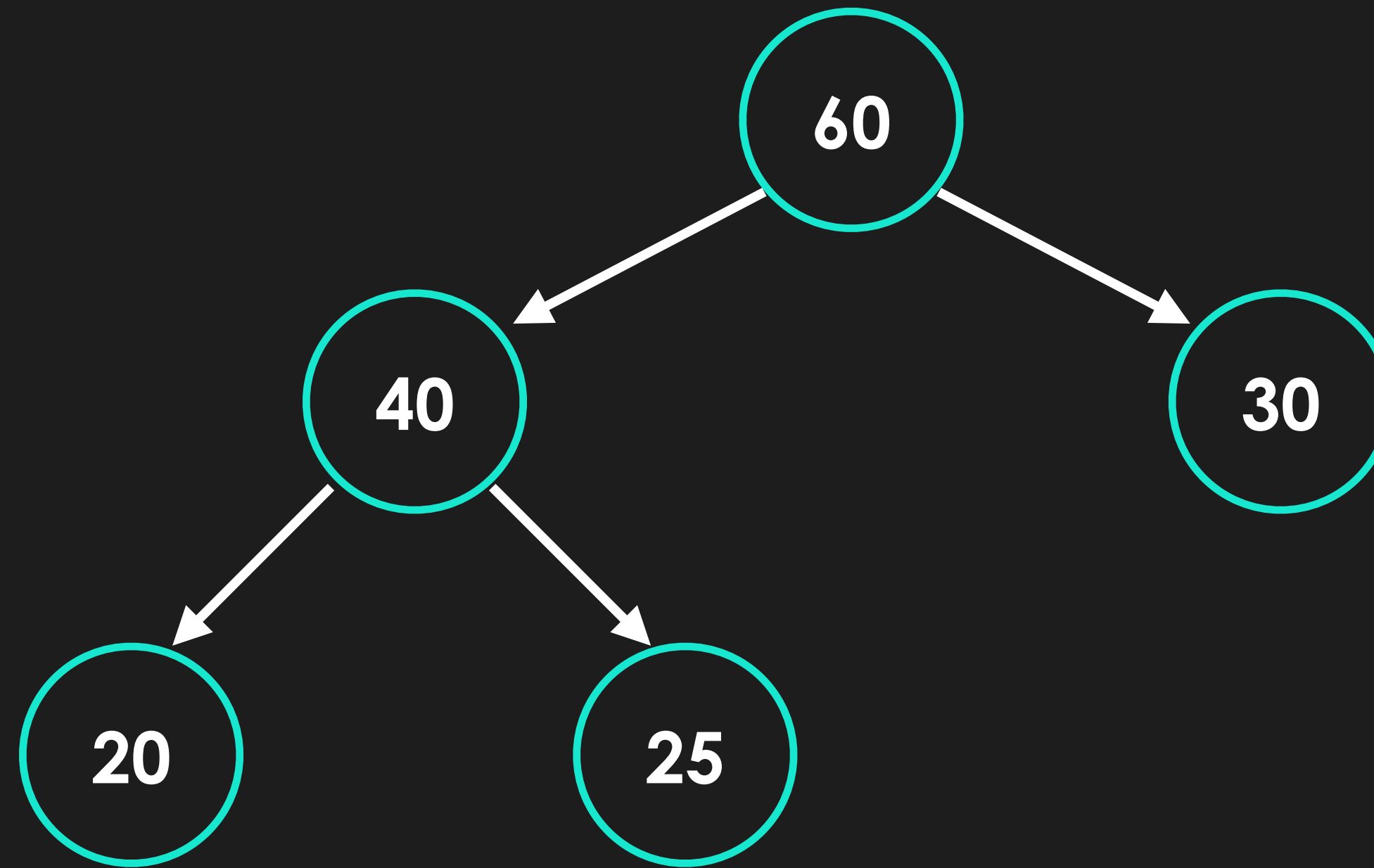
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Binary Heaps are a **more efficient** implementation of priority queues, and we will soon see why!

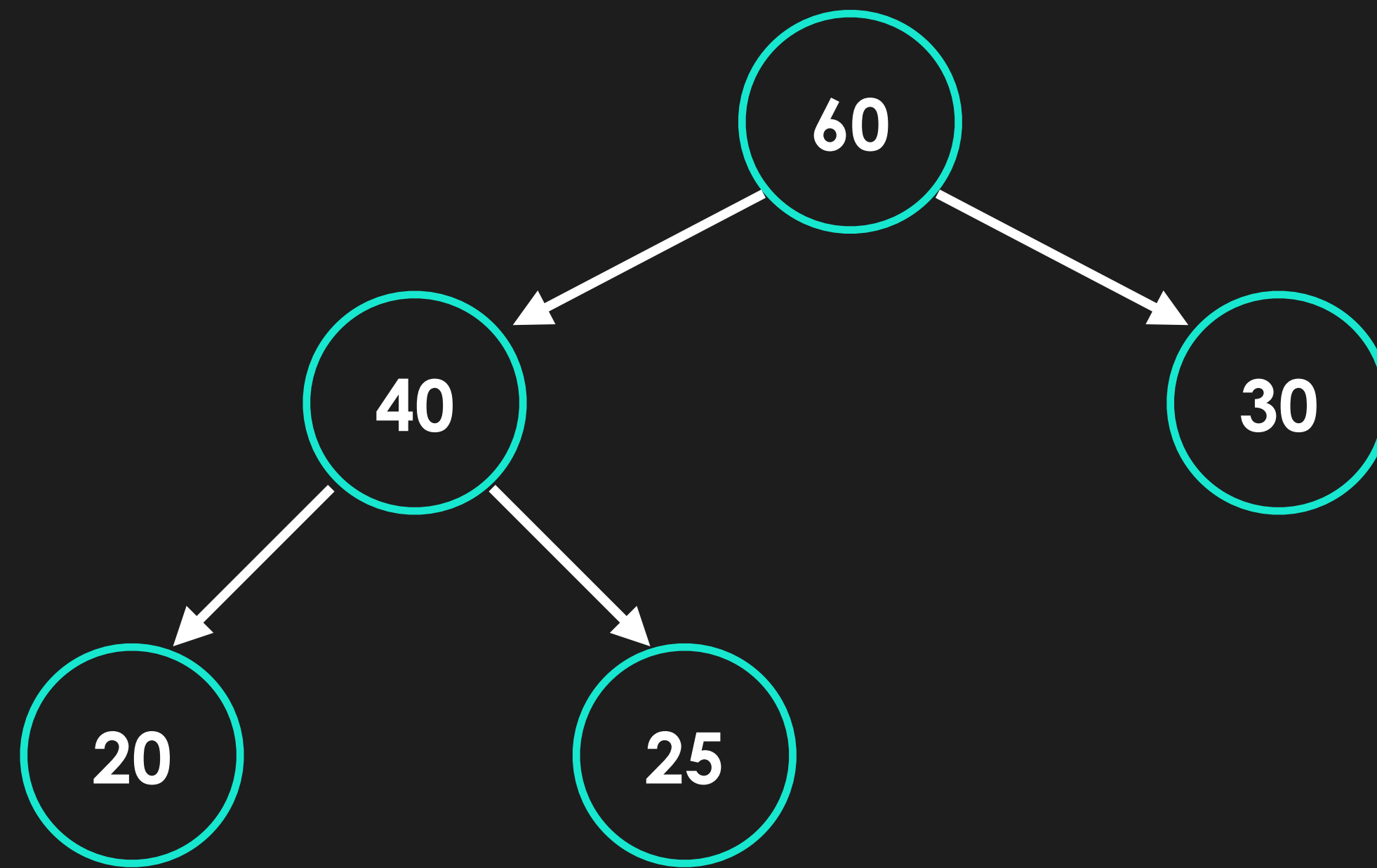
# Binary Heap Representation

# HeapItem Class

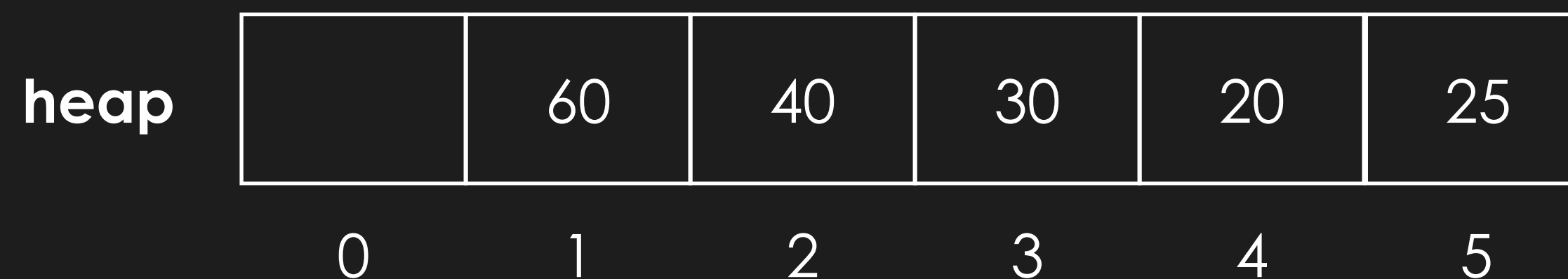
```
class HeapItem:  
    def __init__(self, key, value):  
        self.key = key  
        self.value = value
```

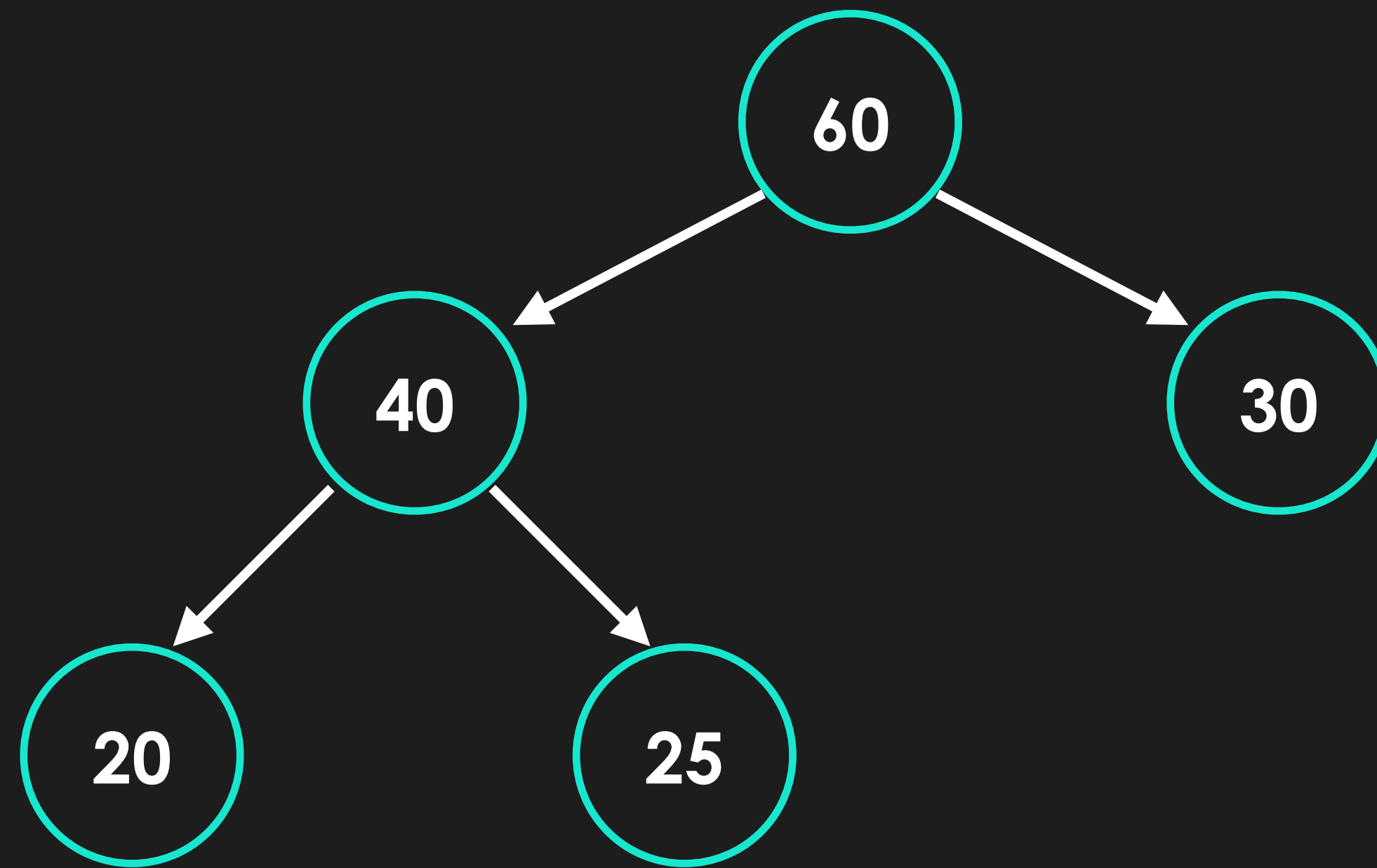


**To represent binary heaps, we often use arrays (lists)**



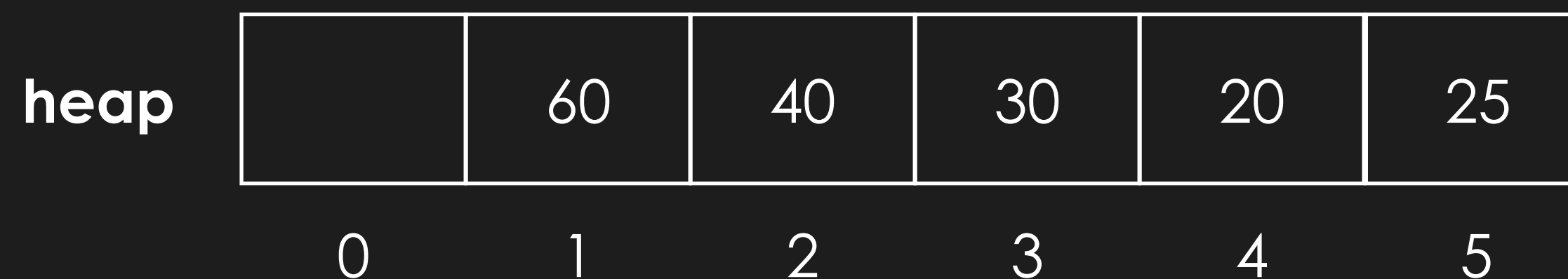
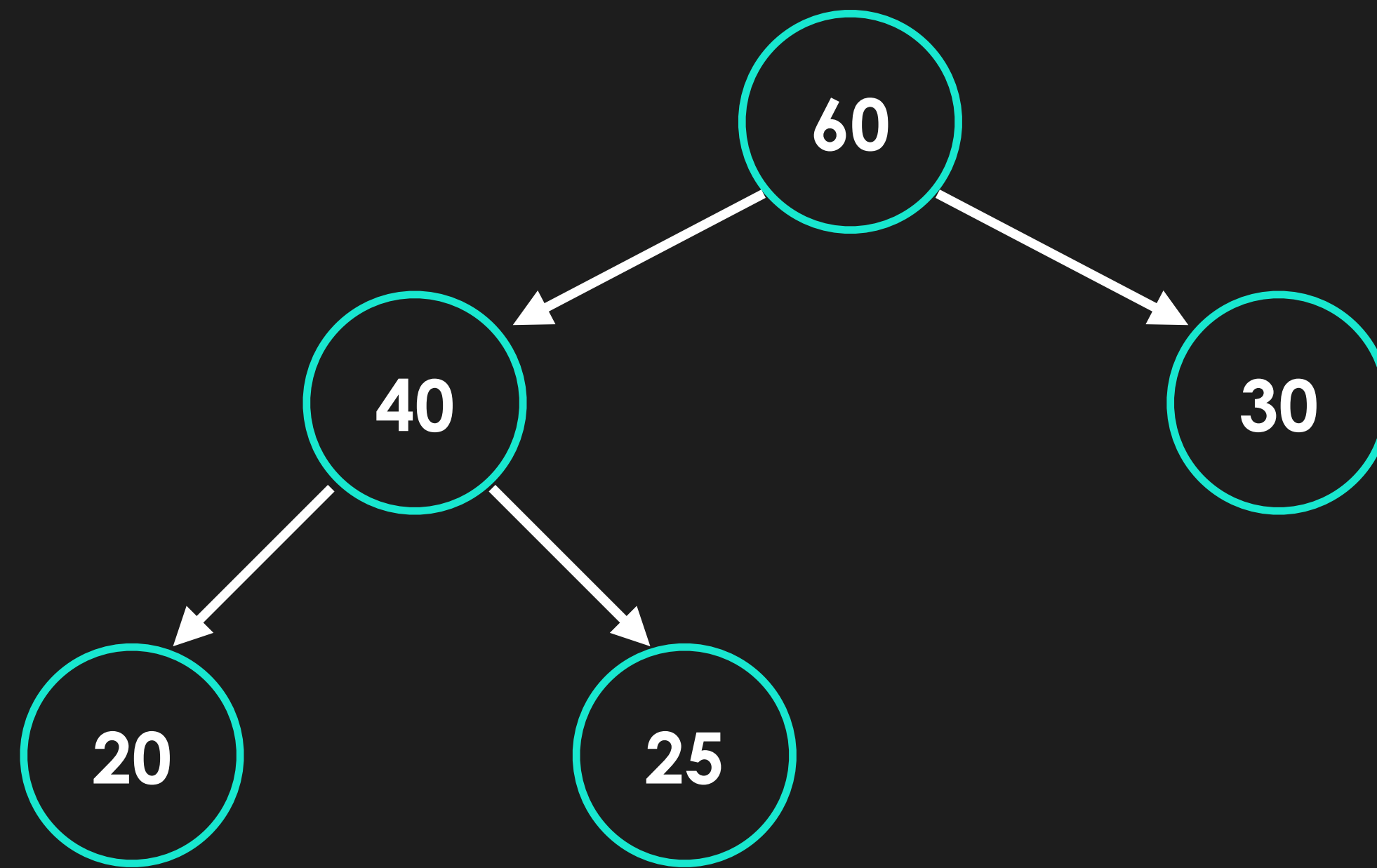
We only show the **value** of each HeapItem in the visualisation. However, each element in the heap is really a **HeapItem** class





For a node at **index N**:

- It's **left child node** will be at index  $2 * N$
- It's **right child node** will be at index  $(2 * N + 1)$



For a node at **index N**:

- It's **left child node** will be at index  $2 * N$
- It's **right child node** will be at index  $(2 * N + 1)$

The **root node** will always hold **index 1** and we leave index 0 of our list empty to make things easier

# Implementation of Max Heap



# API

```
class MaxHeap:
    def __init__(self, capacity):
        self.capacity = capacity
        self.heap = [None] * (capacity + 1)

    def sink(self, index):
        pass

    def swim (self, index):
        pass

    def insert(self, index):
        pass

    def getMax(self, index):
        pass
```

# Helpers

```
# HELPER FUNCTIONS
def parent (index):
    return index // 2

def left (index):
    return index * 2

def right (index):
    return index * 2 + 1

def swap (array, index1, index2):
    array[index1], array[index2] = array[index2], array[index1]
```

# Max Heap Construction

# Initialisation

**pq = MaxHeap(10)**

```
def __init__(self, maxsize):  
    self.maxsize = maxsize  
    self.size = 0  
    self.heap = [None] * (maxsize + 1)
```

**pq = MaxHeap(10)**

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def __init__(self, maxsize):  
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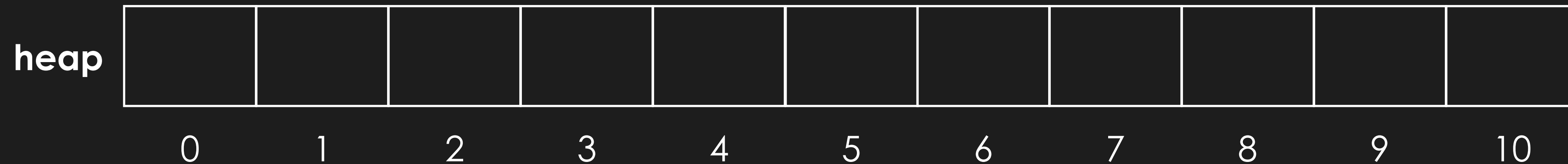


# Insertion

## STEP 1: Check if capacity is reached

**pq.insert(30)**

```
if self.size >= self.maxsize:  
    print('size limit reached')  
    return
```

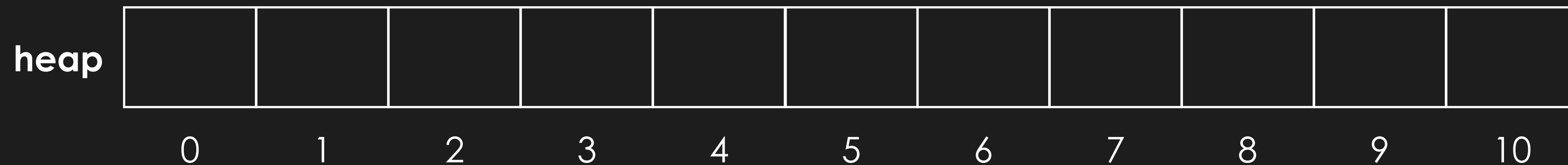




**STEP 2: Increment size and  
insert into heap at index size**

**pq.insert("Google", 30)**

```
self.size += 1  
self.heap[self.size] = HeapItem(newKey,  
newValue)
```

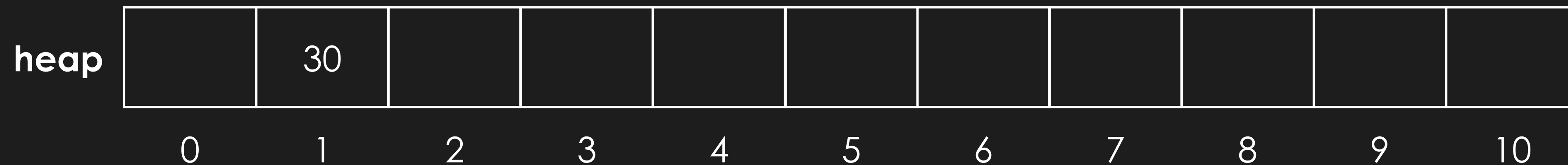


**STEP 2: Increment size and  
insert into heap at index size**

30

**pq.insert("Google", 30)**

```
self.size += 1  
self.heap[self.size] = HeapItem(newKey,  
newValue)
```



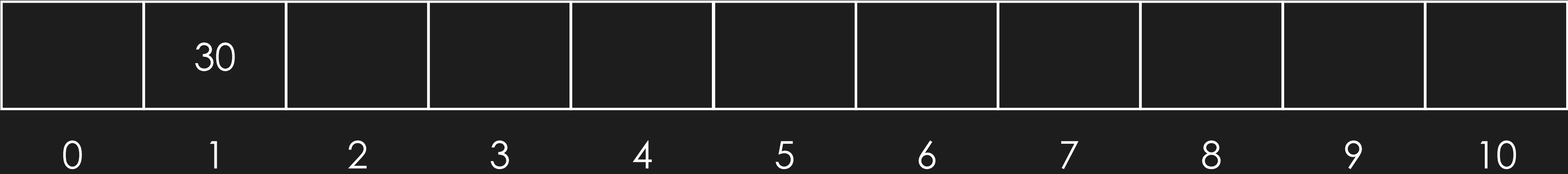
STEP 3: While parent node has higher priority, swap with parent node



pq.insert("Google", 30)

```
self.swim(self.size)
```

heap



STEP 1: Check if capacity is reached



pq.insert("Amazon", 20)

```
if self.size >= self.maxsize:
    print('size limit reached')
    return
```

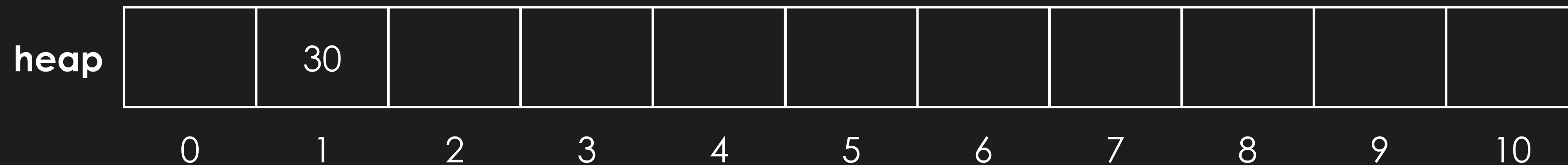


STEP 2: Increment size and  
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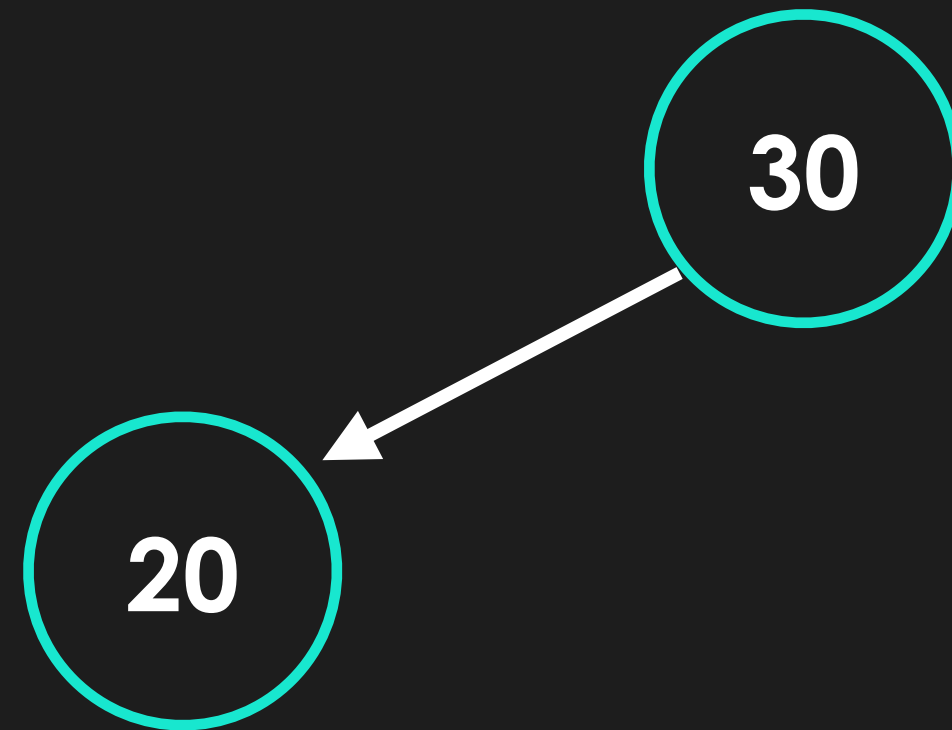
30

`pq.insert("Amazon", 20)`

```
self.size += 1  
self.heap[self.size] = HeapItem(newKey,  
newValue)
```

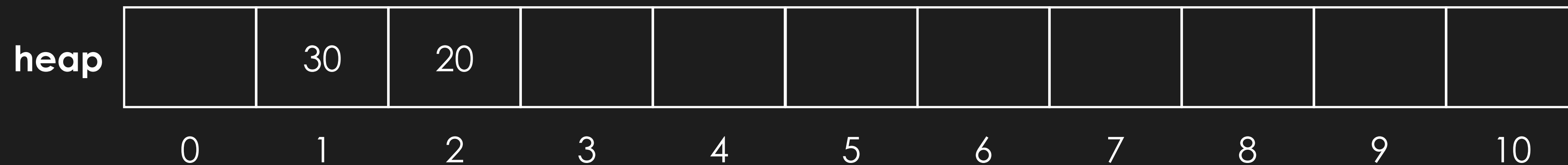


**STEP 2: Increment size and  
insert into heap at index size**

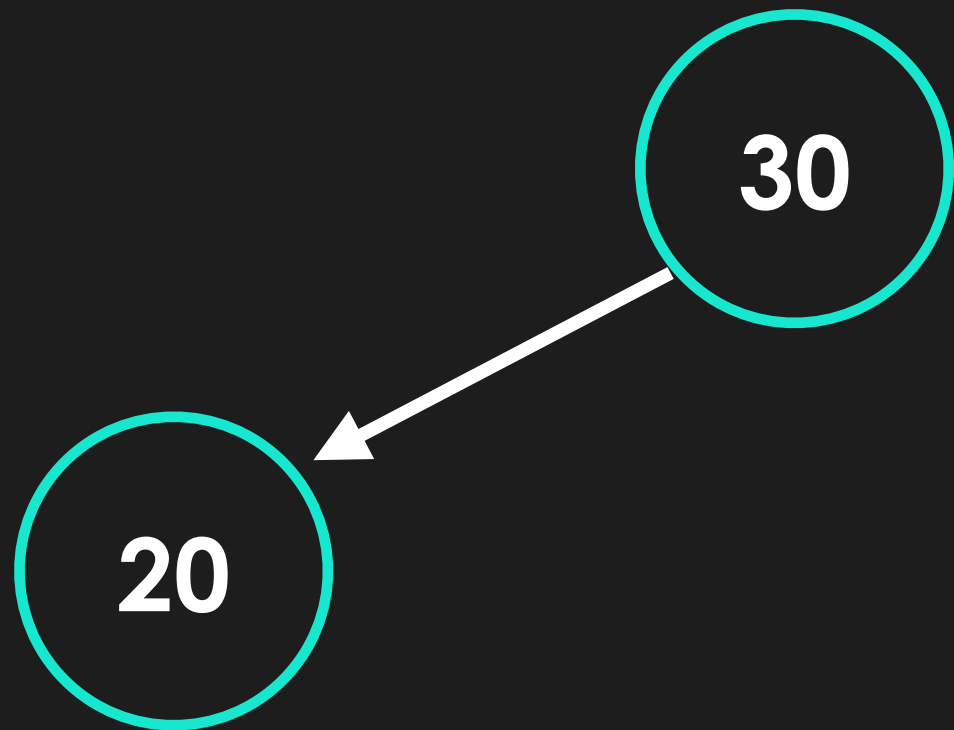


**pq.insert("Amazon", 20)**

```
self.size += 1  
self.heap[self.size] = HeapItem(newKey,  
newValue)
```



STEP 3: While parent node has higher priority, swap with parent node

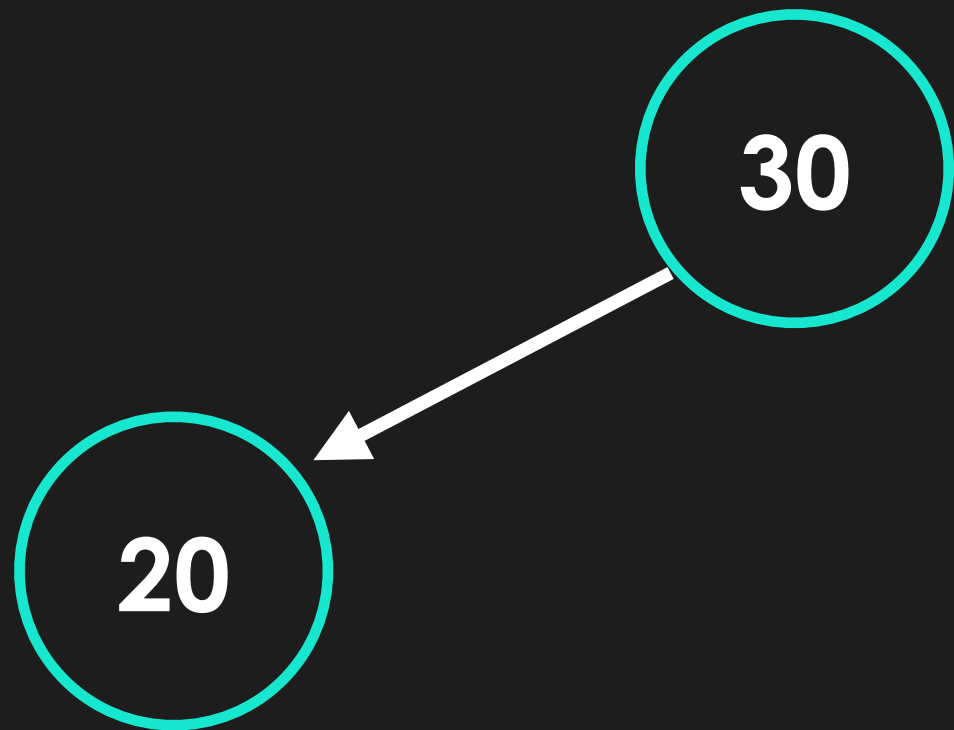


pq.insert("Amazon", 20)

```
self.swim(self.size)
```



STEP 1: Check if capacity is reached



`pq.insert("Apple", 60)`

```
if self.size >= self.maxsize:
    print('size limit reached')
    return
```

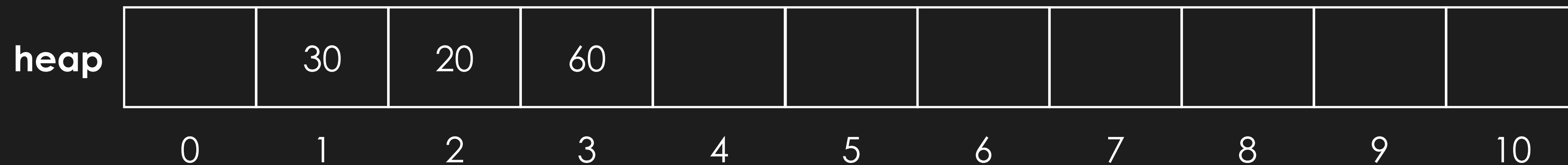
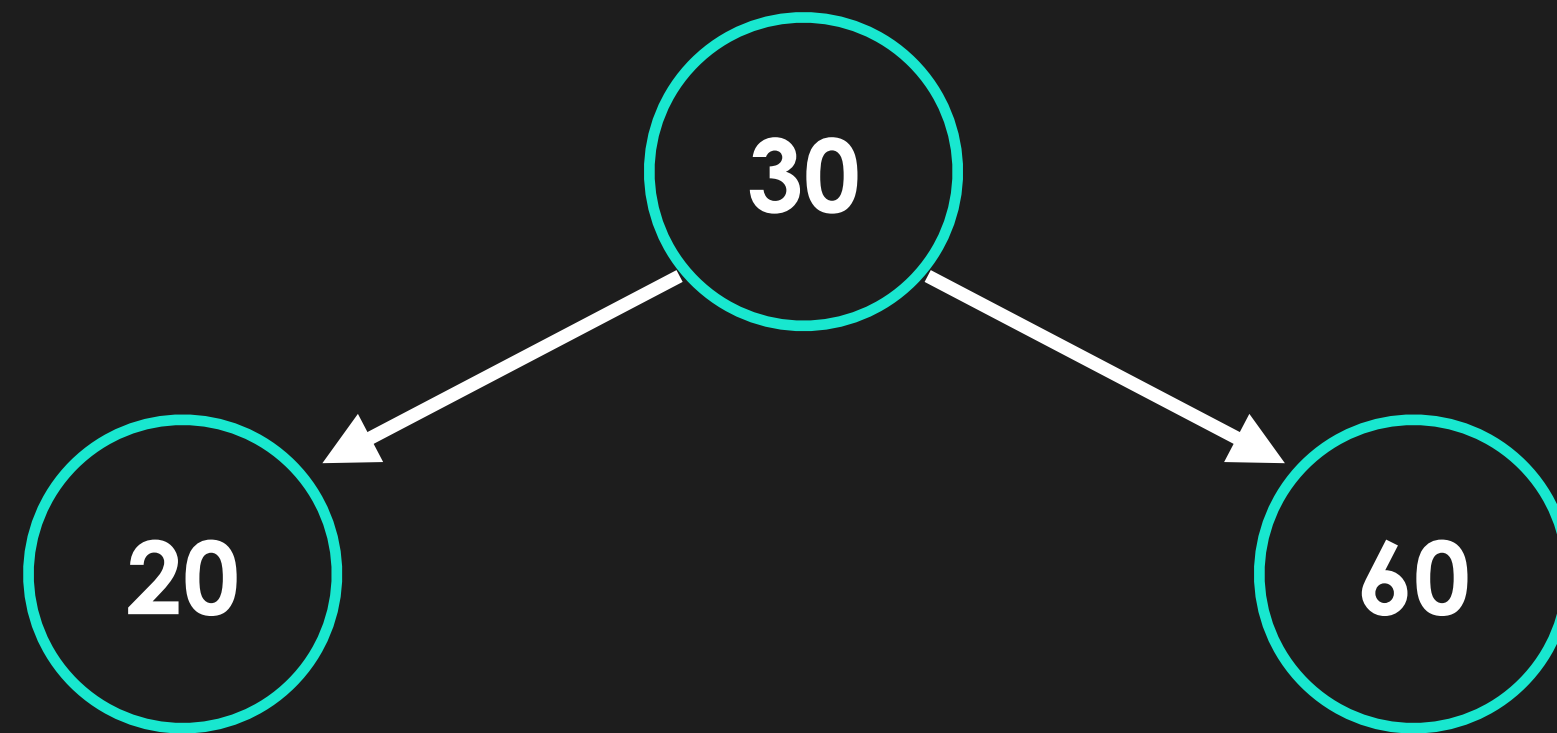




**STEP 2: Increment size and  
insert into heap at index size**

**pq.insert("Apple", 60)**

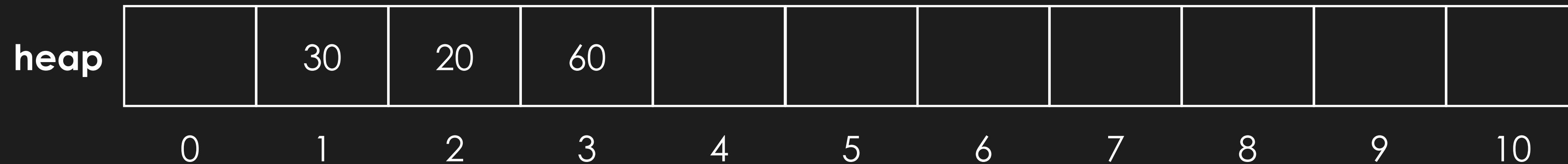
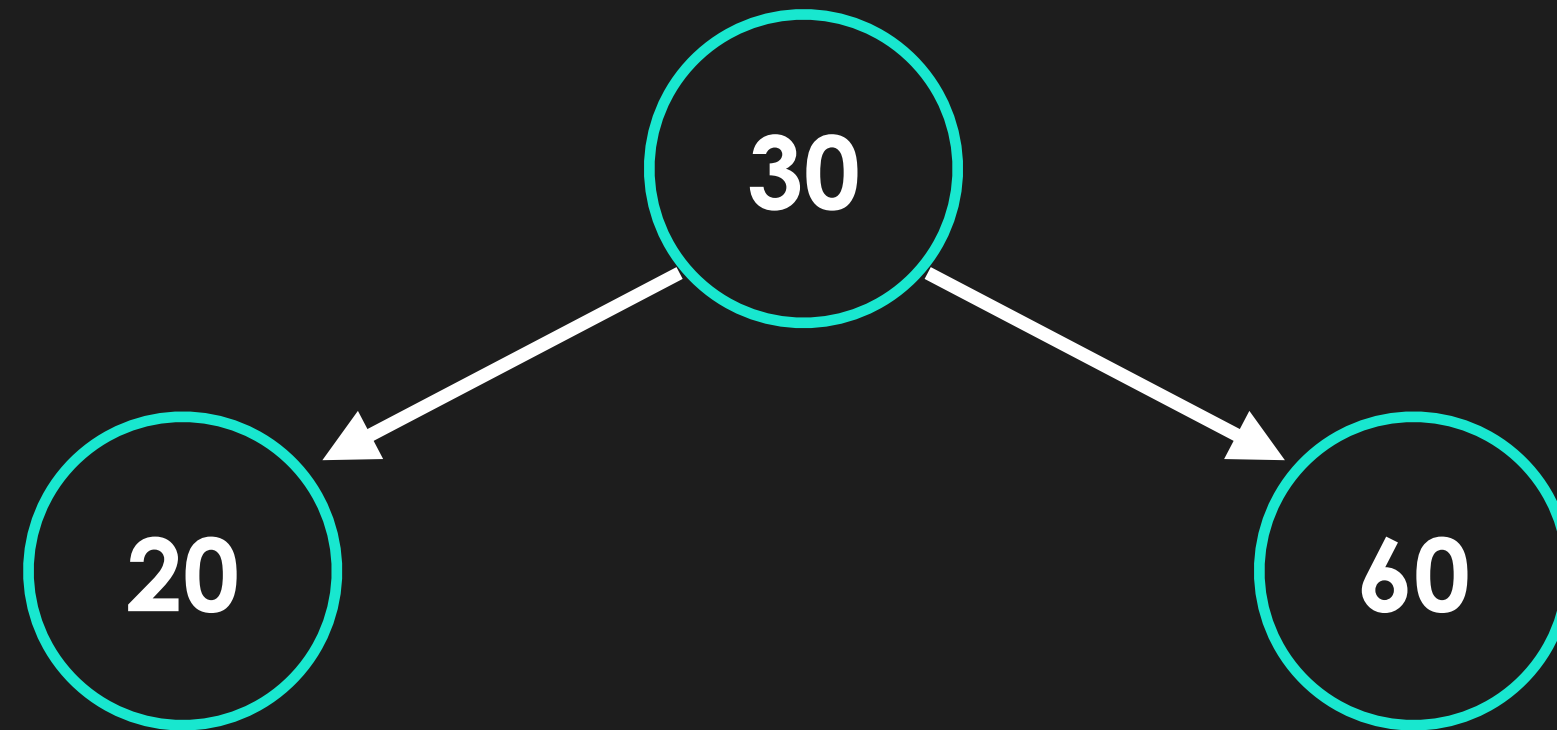
```
self.size += 1  
self.heap[self.size] = HeapItem(newKey,  
newValue)
```



**STEP 3: While parent node has higher priority, swap with parent node**

**pq.insert("Apple", 60)**

```
self.swim(self.size)
```



**swim**

# greater

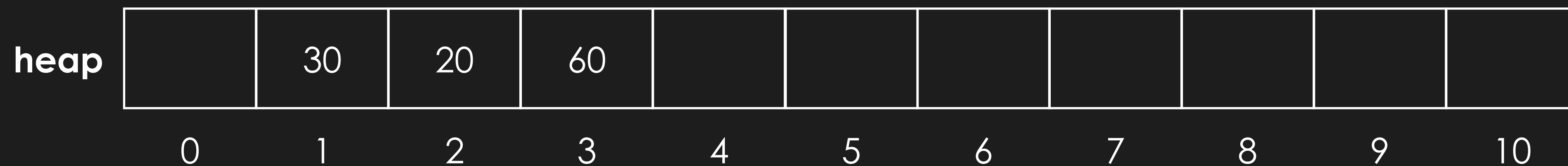
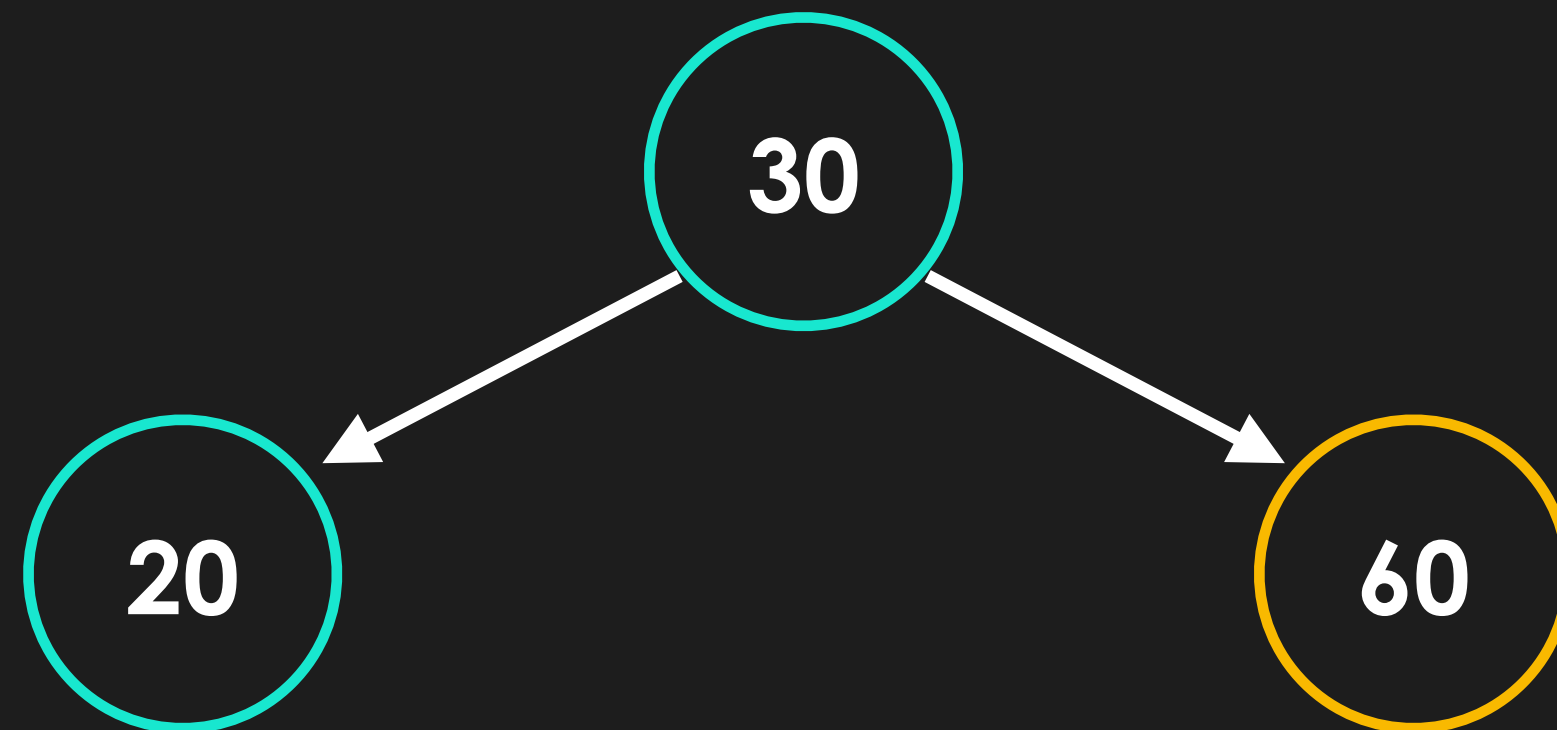
```
def greater(self, index1, index2):  
    if self.heap[index1].value > self.heap[index2].value:  
        return True  
    else:  
        return False
```

We define a method **greater** which returns **True** if HeapItem at **index1** has a greater value (higher priority) than HeapItem at **index2**

**swim(3)**

```
while (index != 1 and self.greater(index,
parent(index))):
    swap(self.heap, index, parent(index))
    index = parent(index)
```

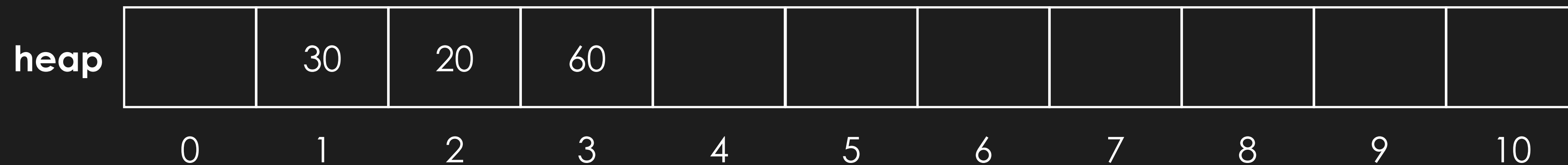
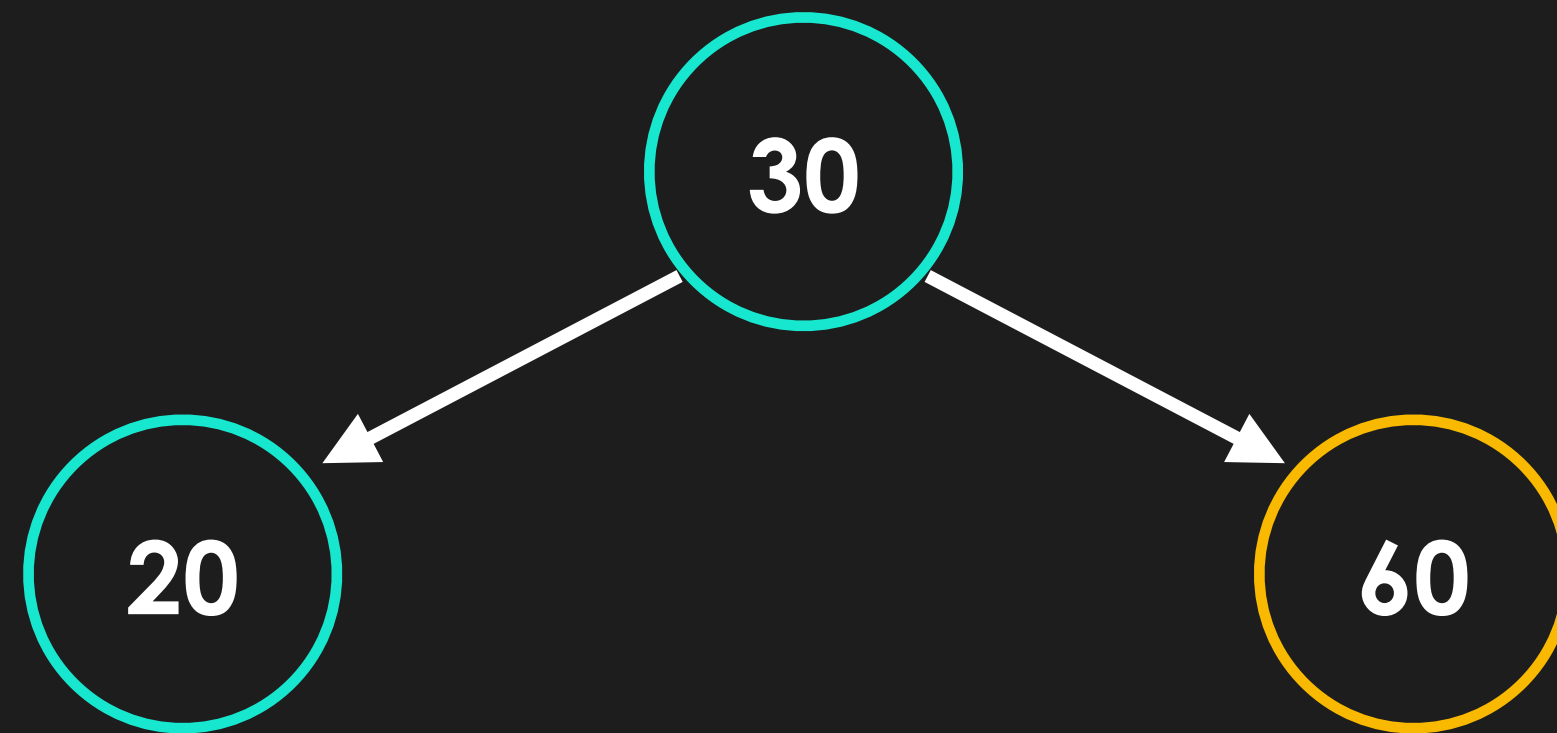
**index = 3**



**swim(3)**

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while (index != 1 and self.greater(index,
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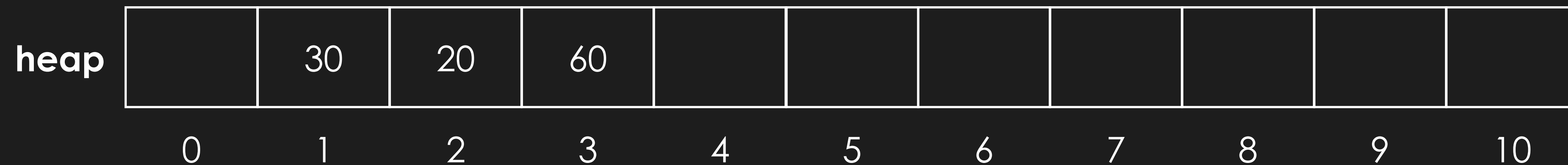
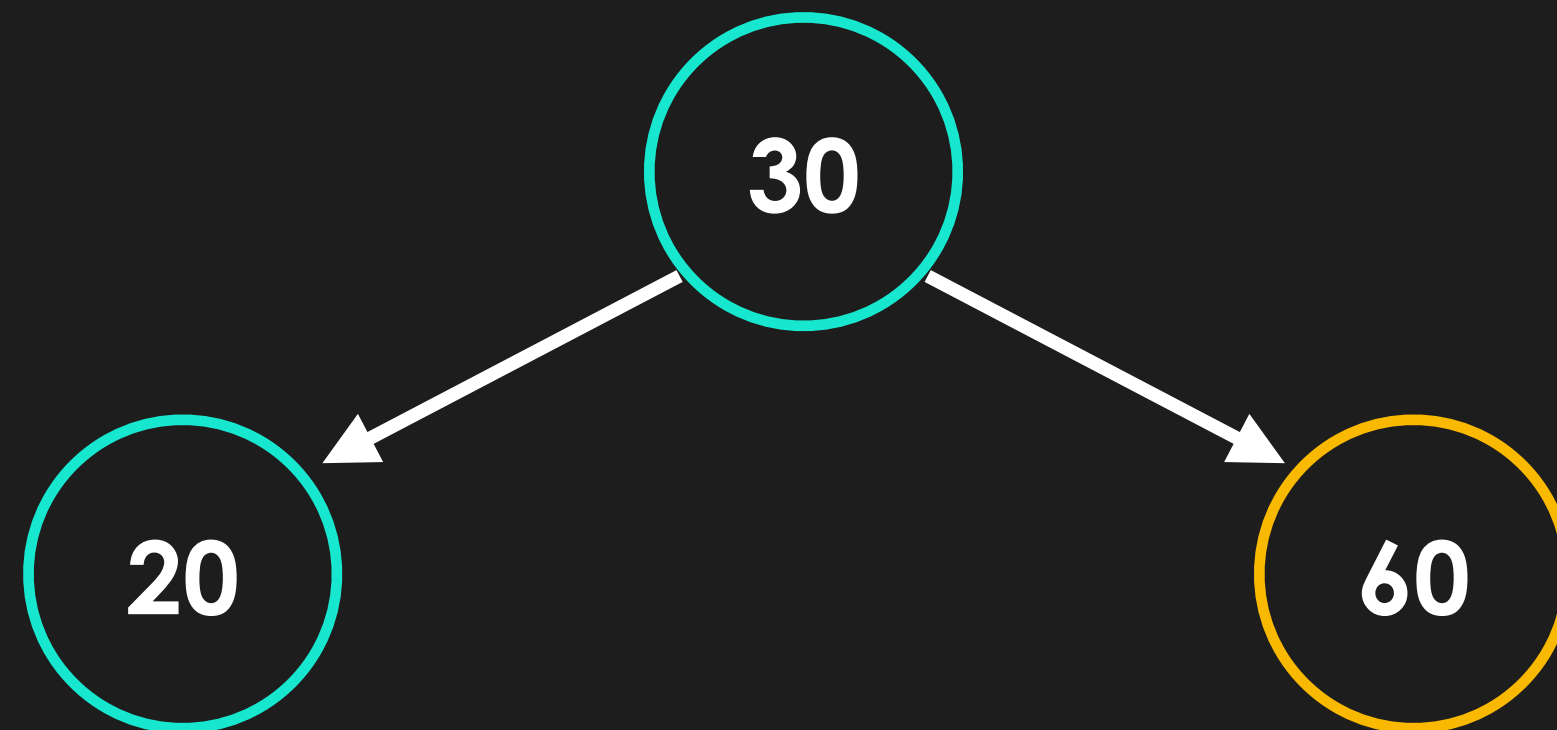
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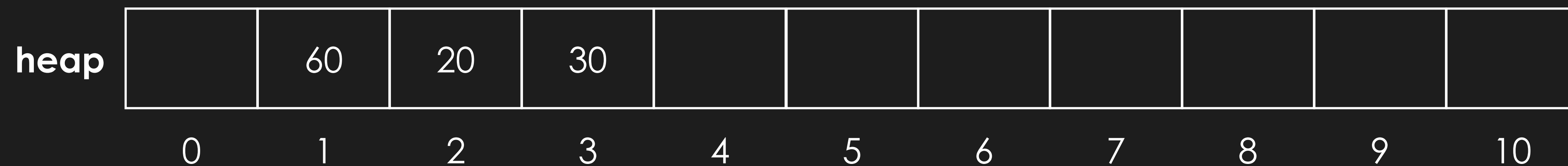
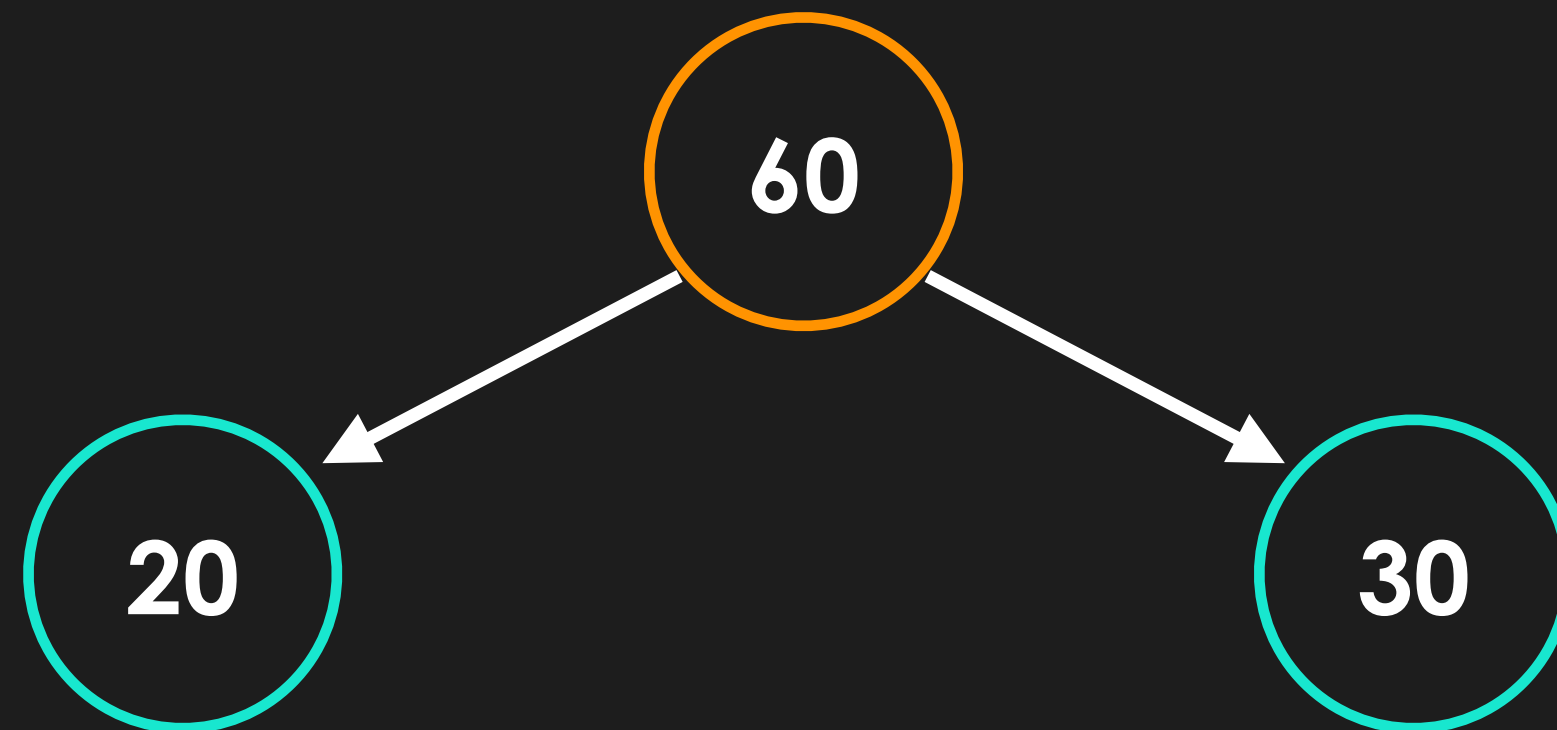
**index = 3**



**swim(3)**

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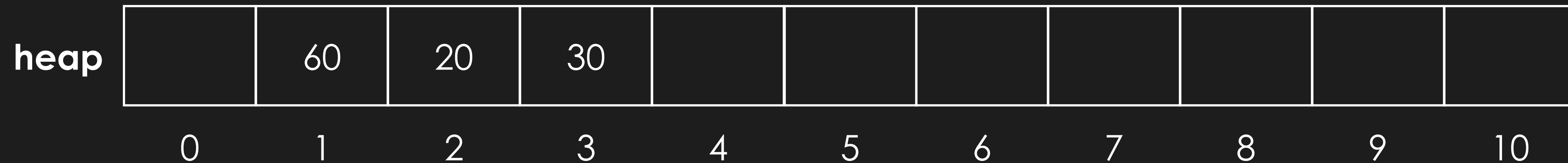
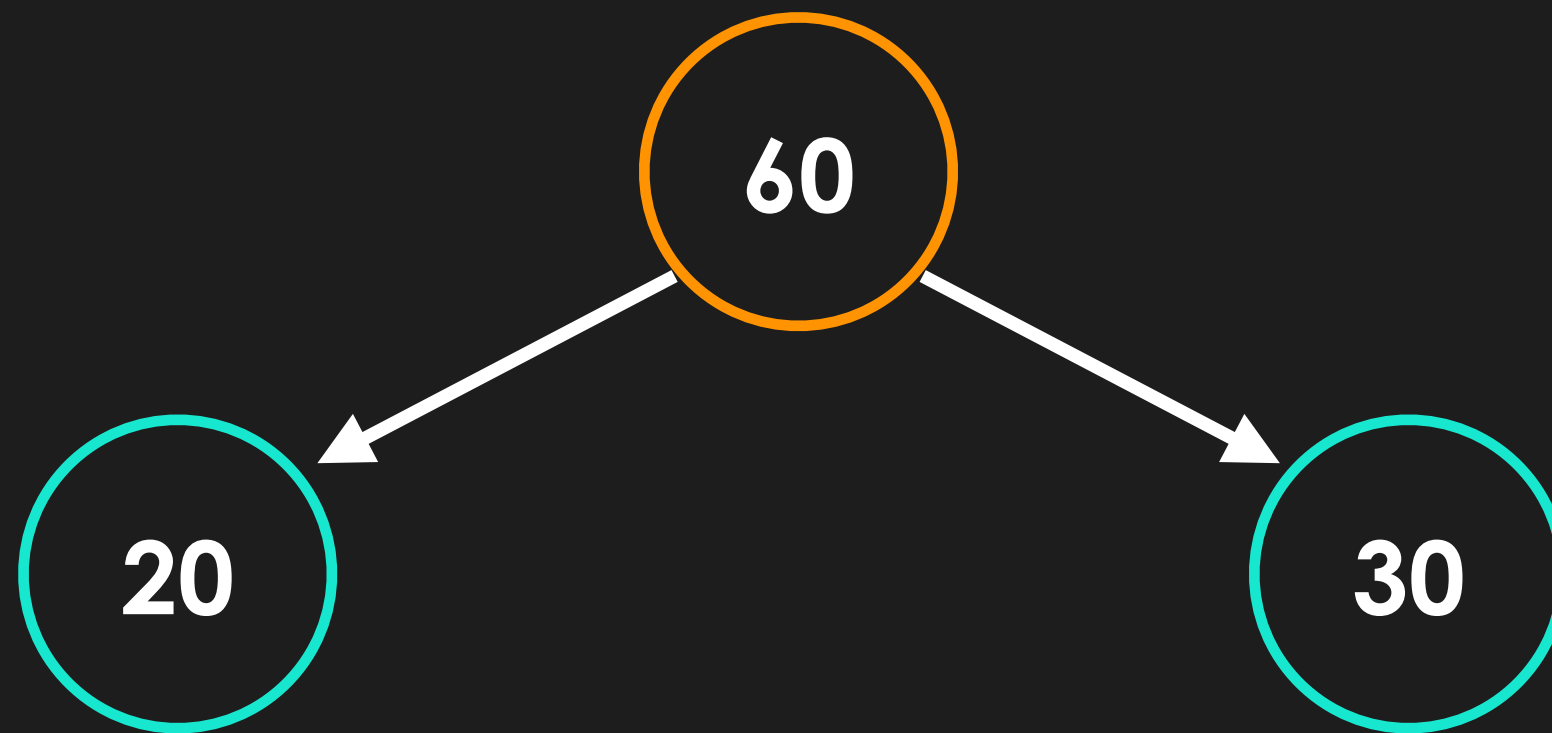




**swim(3)**

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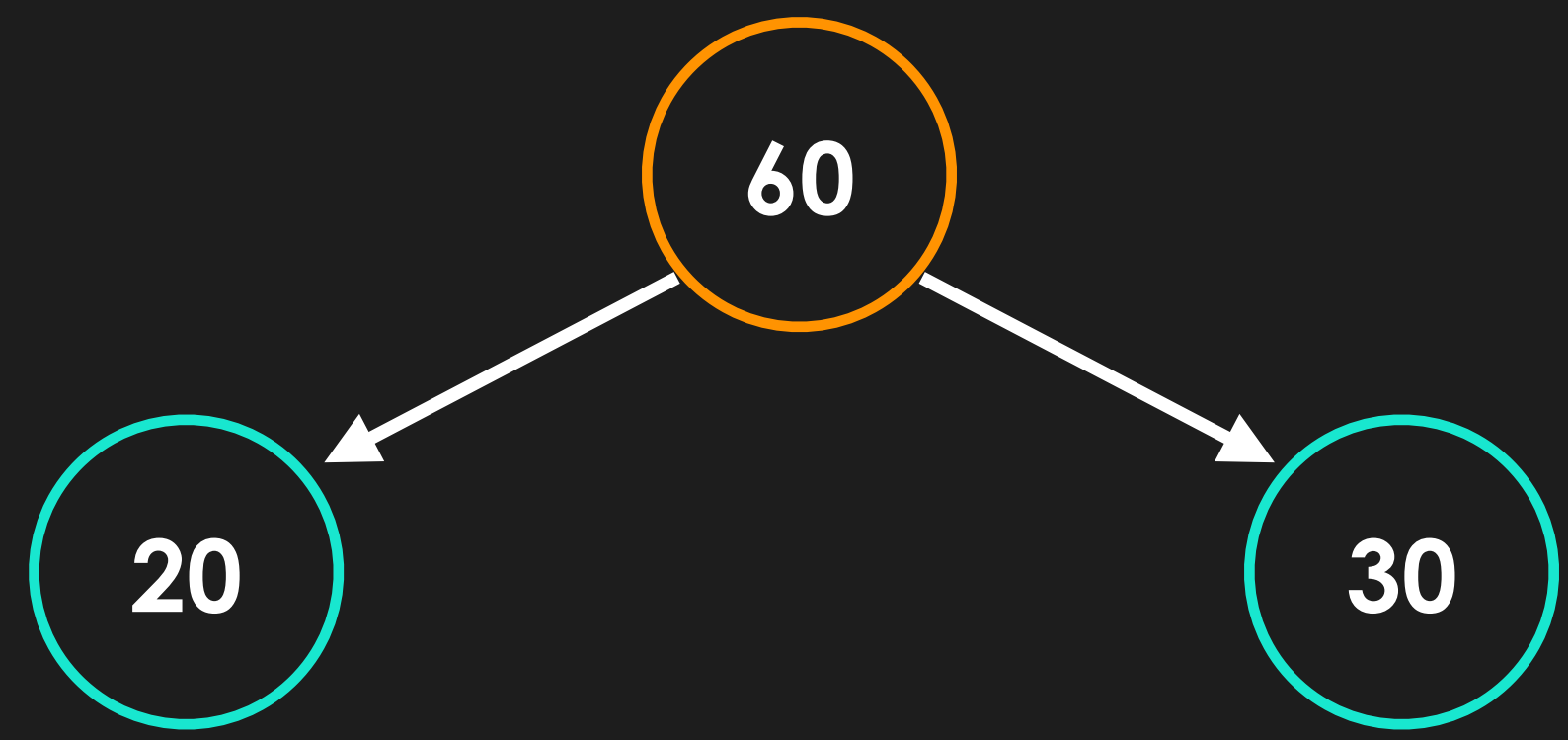
**index = 3**



swim(3)

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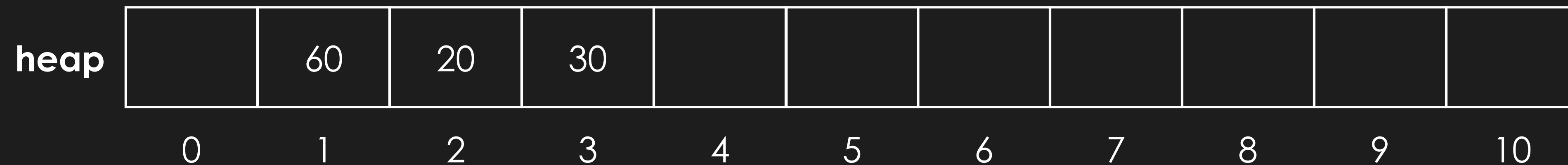
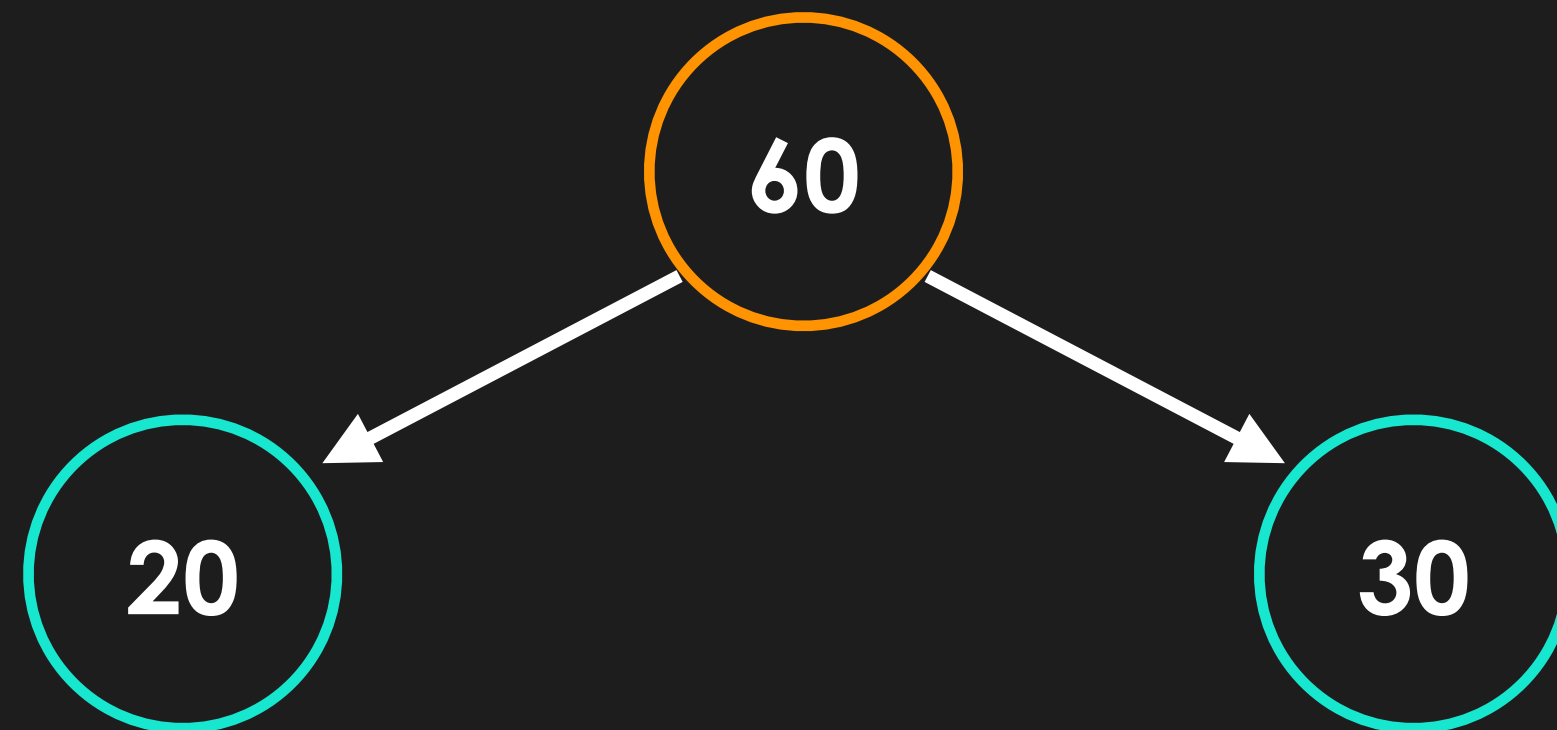
index = 1



**swim(3)**

```
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```

**index = 1**

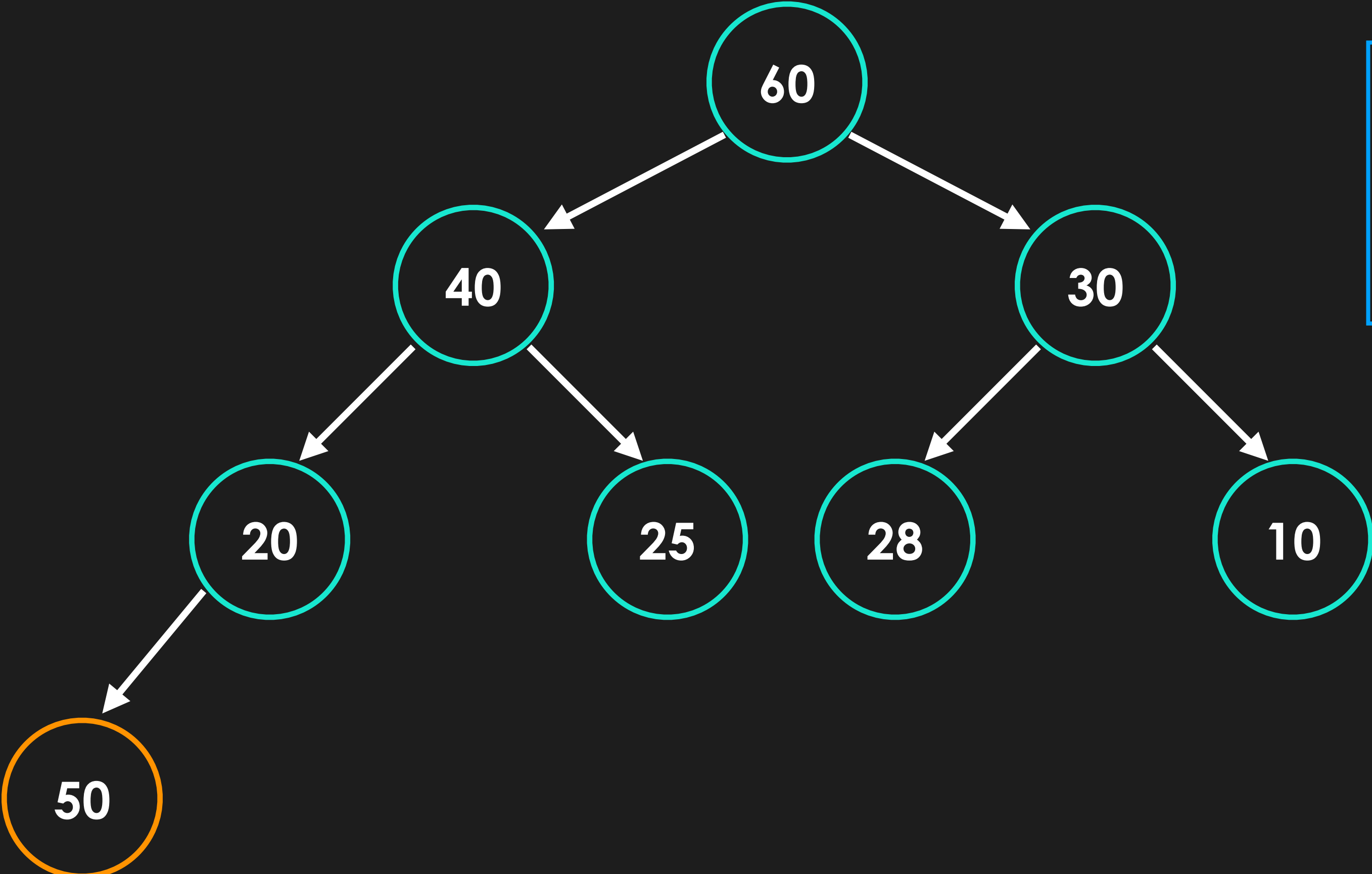


# swim example 2

swim(8)

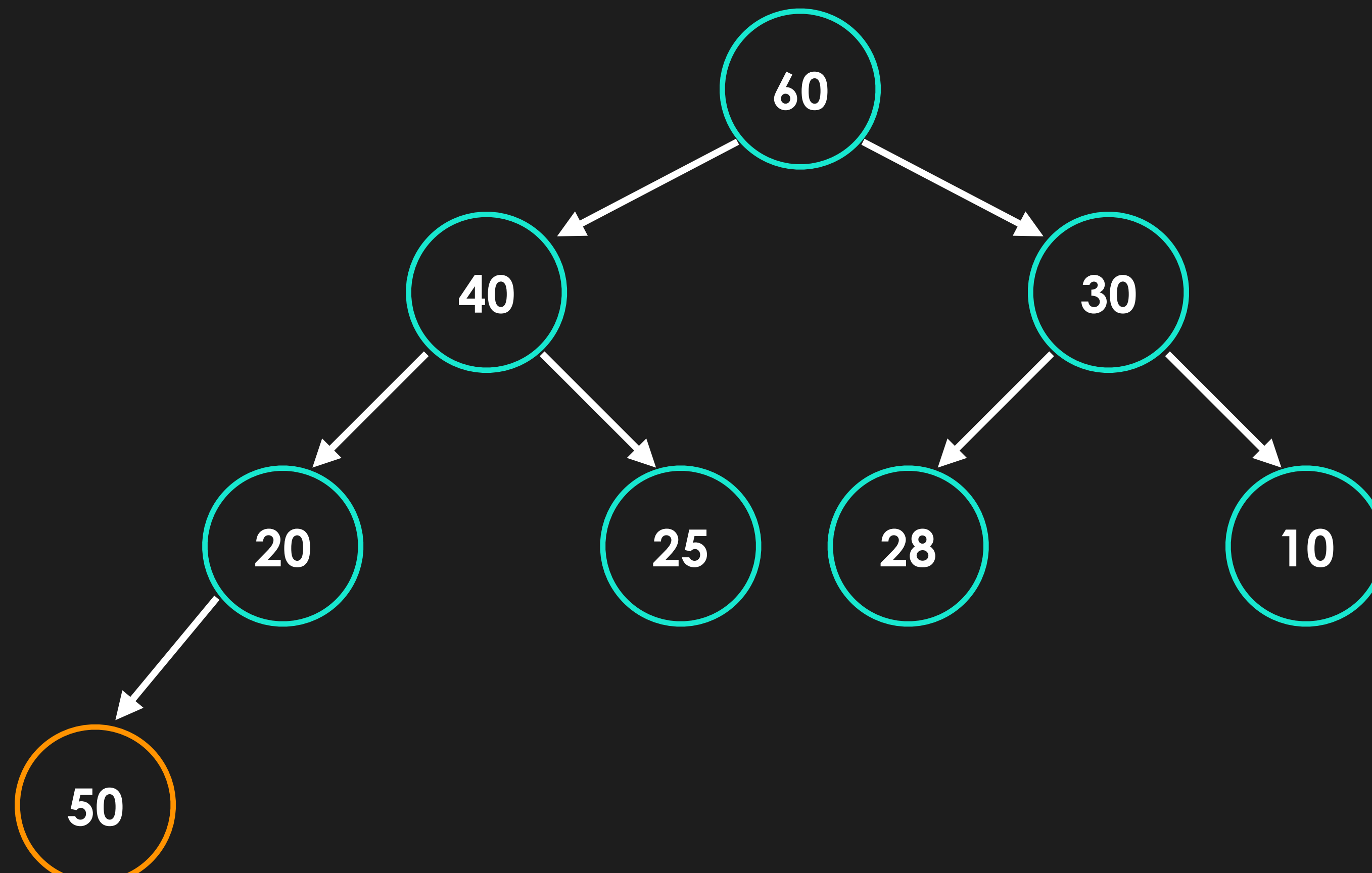
```
while (index != 1 and self.greater(index, parent(index))):  
    swap(self.heap, index, parent(index))  
    index = parent(index)
```

index = 8



heap		60	40	30	20	25	28	10	50		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)

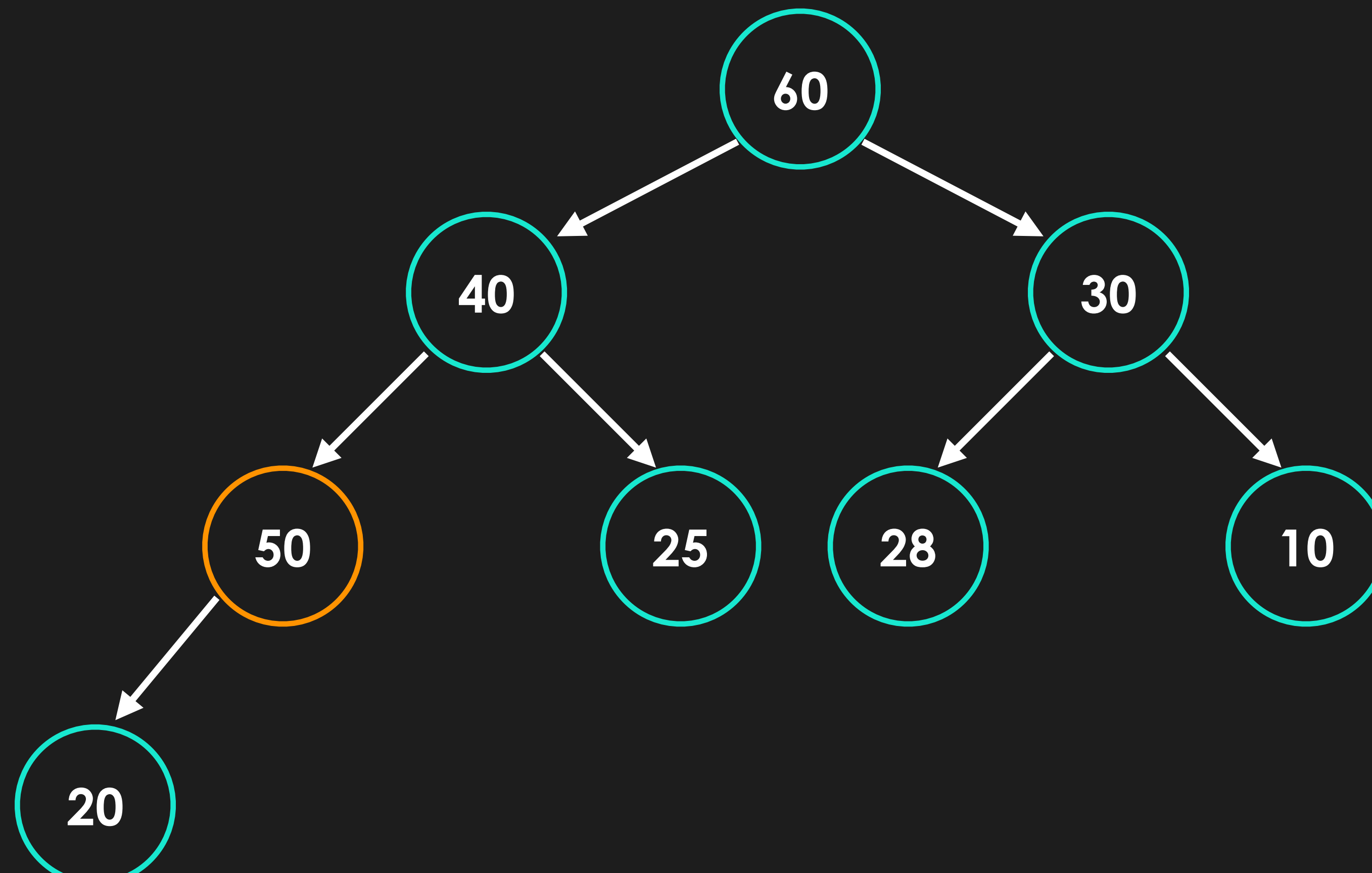


```
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    index = parent(index)
```

index = 8

heap		60	40	30	20	25	28	10	50		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)

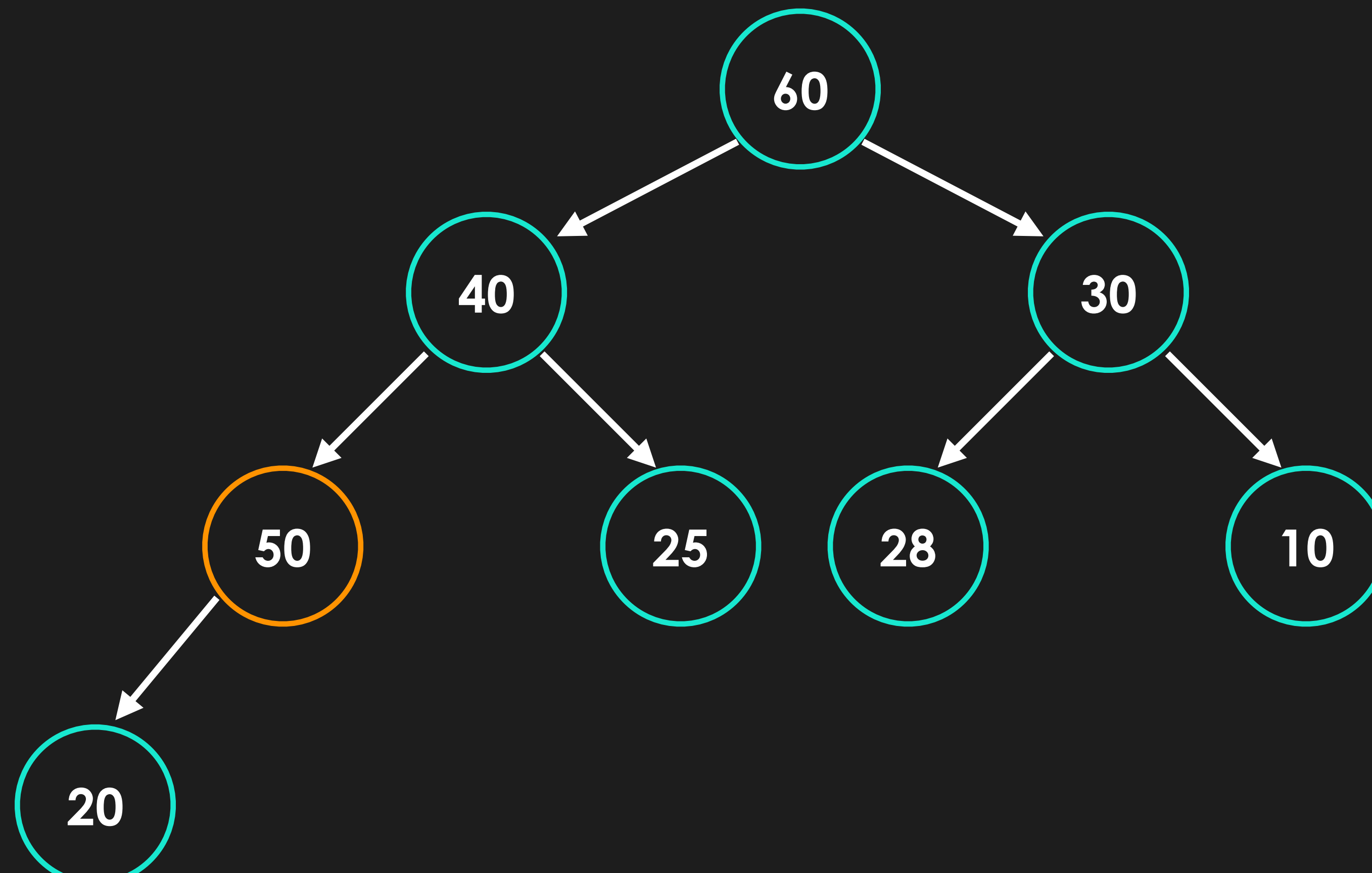


```
while (index != 1 and self.greater(index, parent(index))):  
    swap(self.heap, index, parent(index))  
    index = parent(index)
```

index = 8

heap		60	40	30	50	25	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)



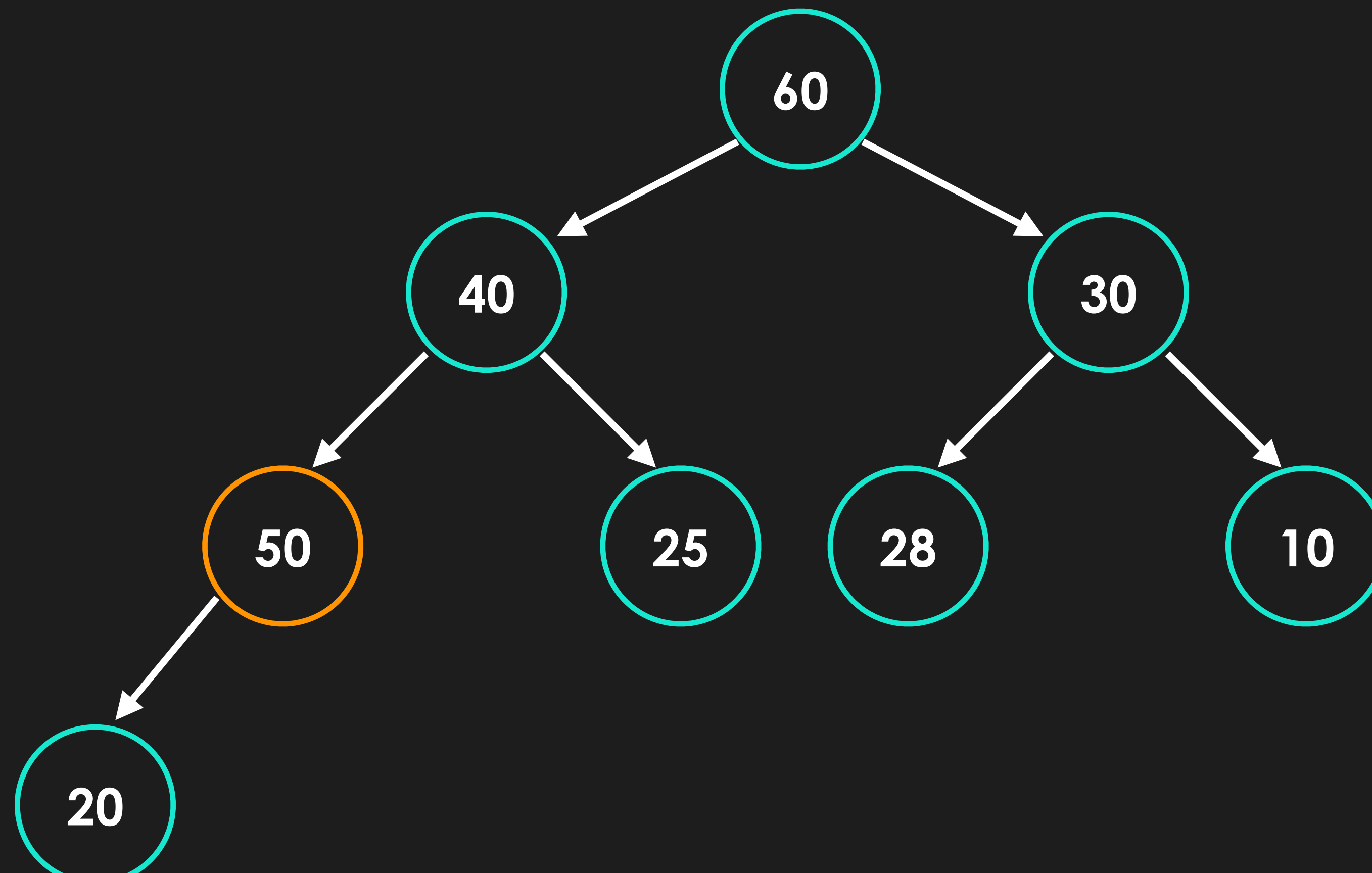
```
while (index != 1 and self.greater(index, parent(index))):
    swap(self.heap, index, parent(index))
    index = parent(index)
```

index = 4

heap		60	40	30	50	25	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10



swim(8)

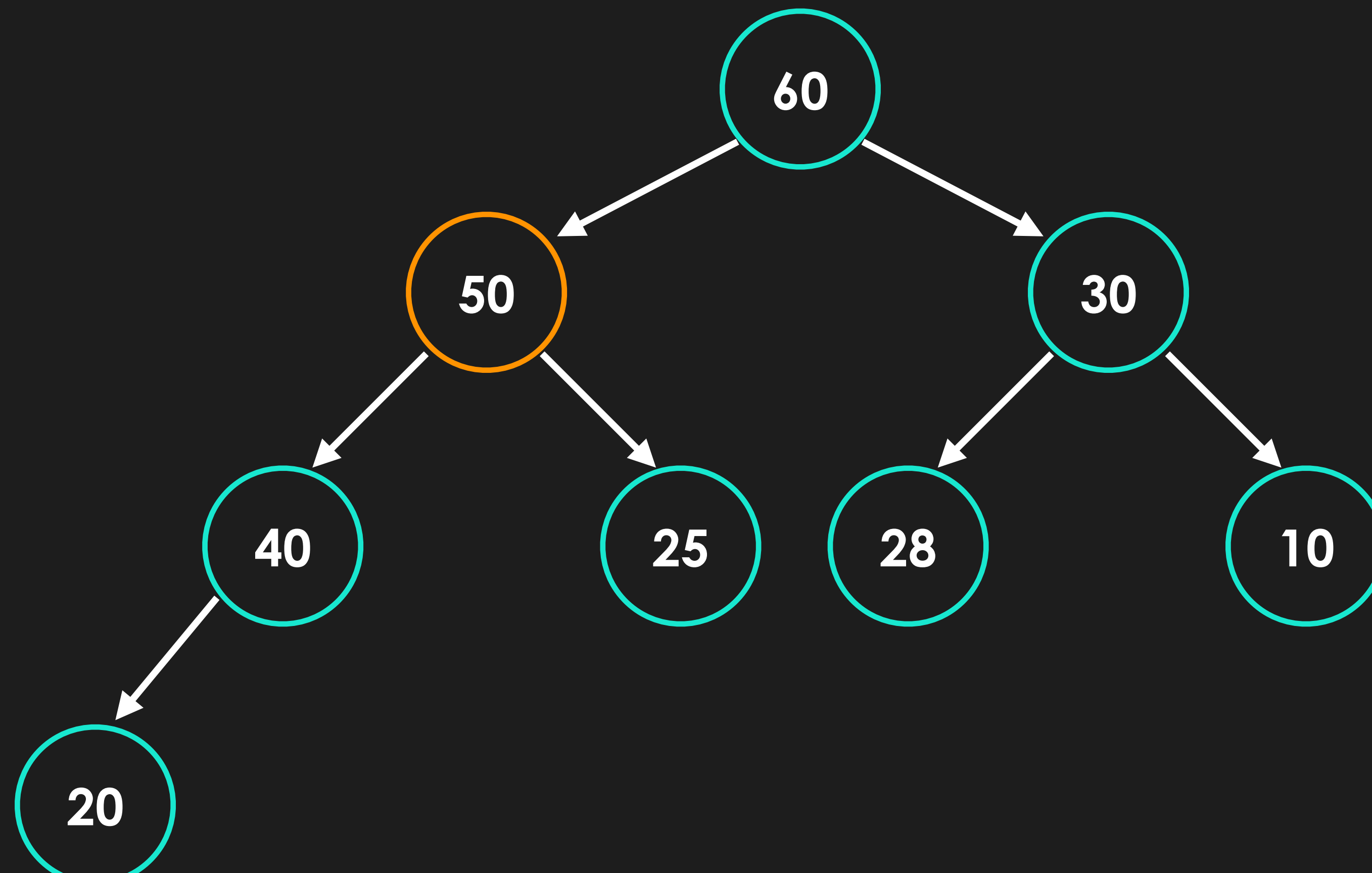


```
while (index != 1 and self.greater(index, parent(index))):  
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    index = parent(index)
```

index = 4

heap		60	40	30	50	25	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)

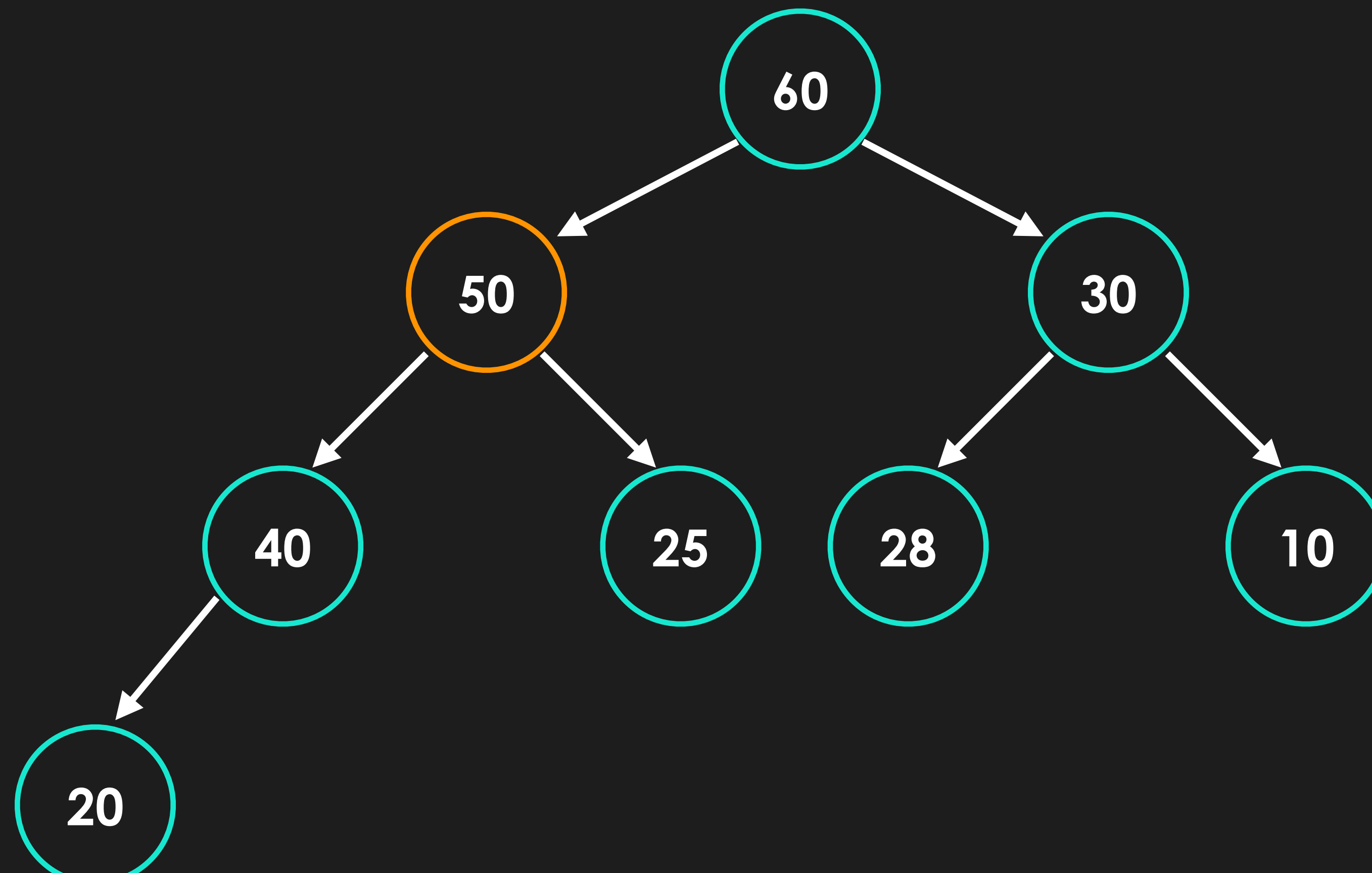


```
while (index != 1 and self.greater(index, parent(index))):
    swap(self.heap, index, parent(index))
    index = parent(index)
```

index = 4

heap		60	50	30	40	25	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)

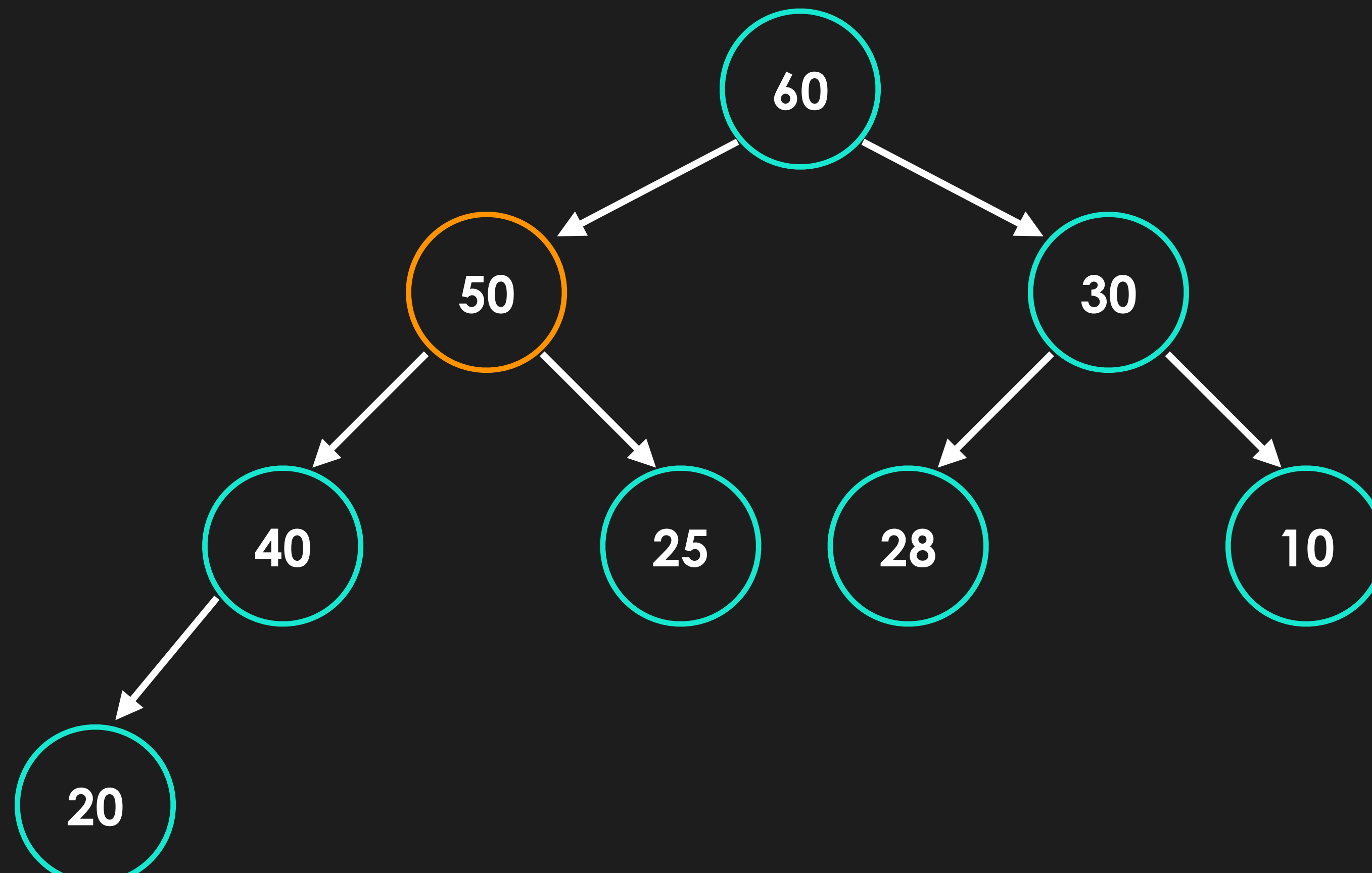


```
while (index != 1 and self.greater(index, parent(index))):
    swap(self.heap, index, parent(index))
    index = parent(index)
```

index = 2

heap		60	50	30	40	25	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10

swim(8)



```
while (index != 1 and self.greater(index, parent(index))):  
    swap(self.heap, index, parent(index))  
    index = parent(index)
```

index = 2



# MaxHeap Insertion

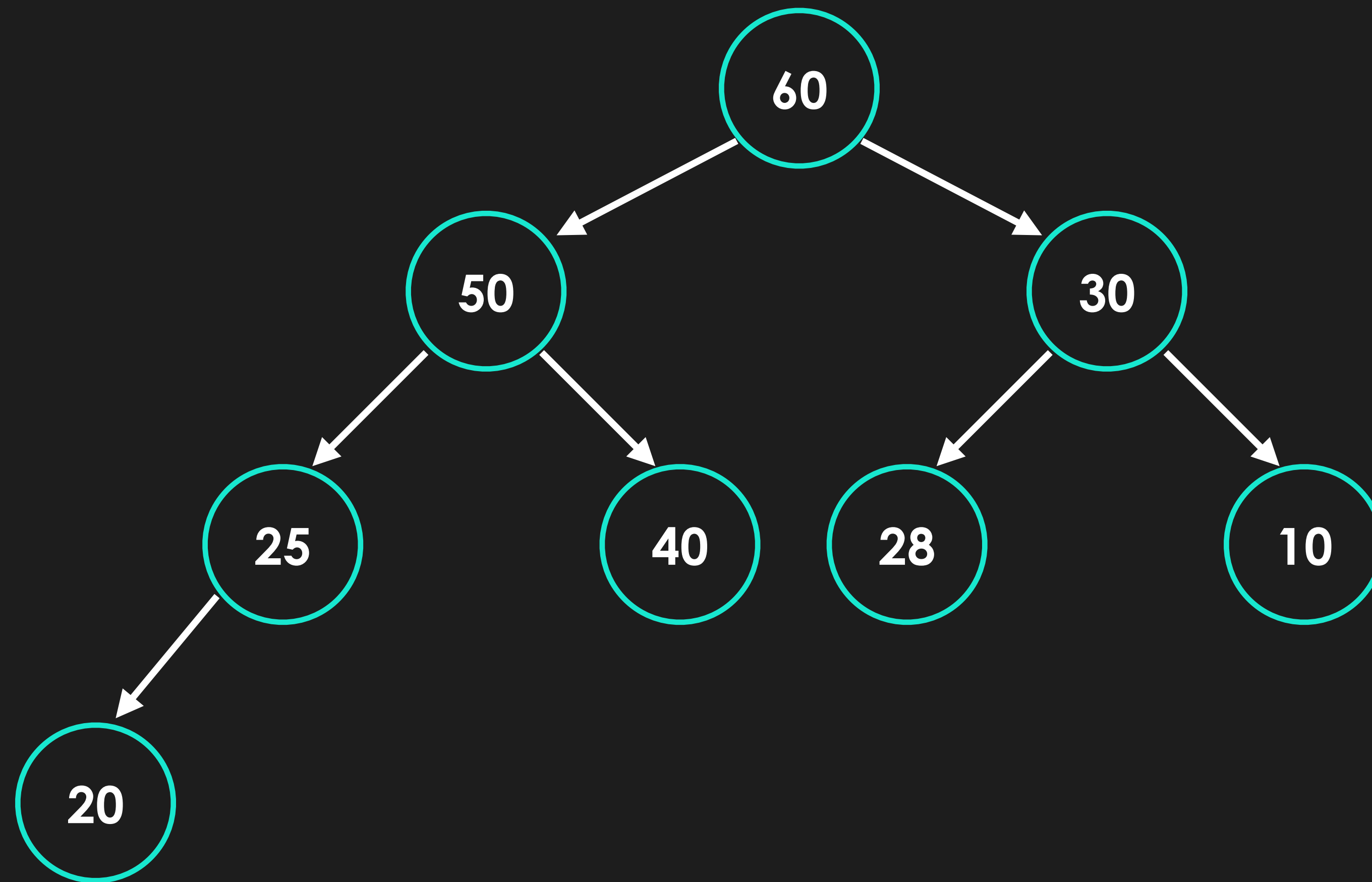
```
def swim (self, index):  
    while (index != 1 and self.greater(index, parent(index))):  
        swap(self.heap, index, parent(index))  
        index = parent(index)  
    return  
  
def insert(self, newKey, newValue):  
    if self.size >= self.maxsize:  
        print('size limit reached')  
        return  
  
    self.size += 1  
    self.heap[self.size] = HeapItem(newKey, newValue)  
    self.swim(self.size)
```

# Max Extraction

# Max Extraction

- **Remove** max element
- **Ensure** Heap order is maintained

getMax()



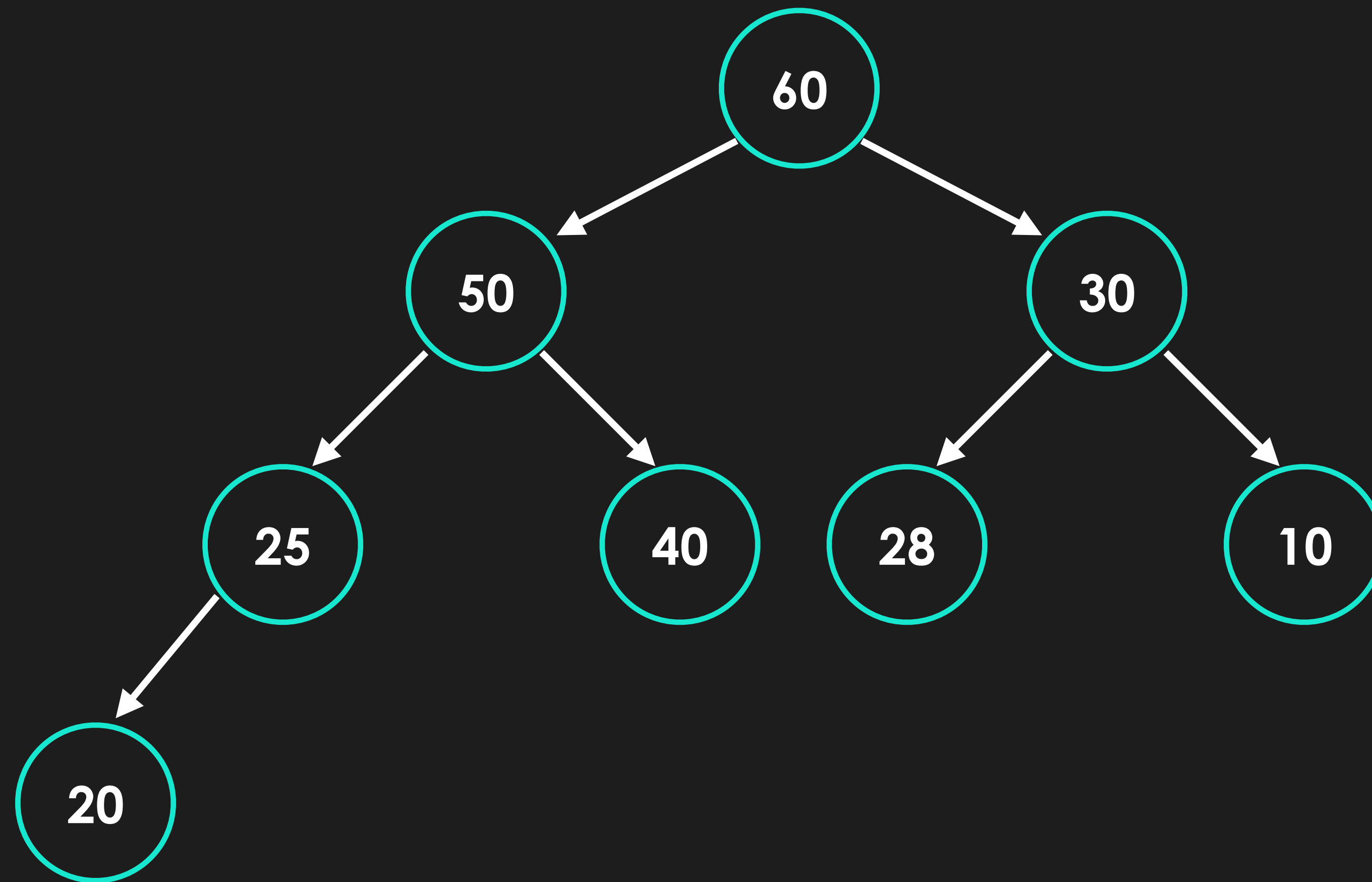
```
maxItem = self.heap[1]
```

**STEP 1: Save max element  
into a variable**

heap		60	50	30	25	40	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10



getMax()



```
swap(self.heap, 1, self.size)
```

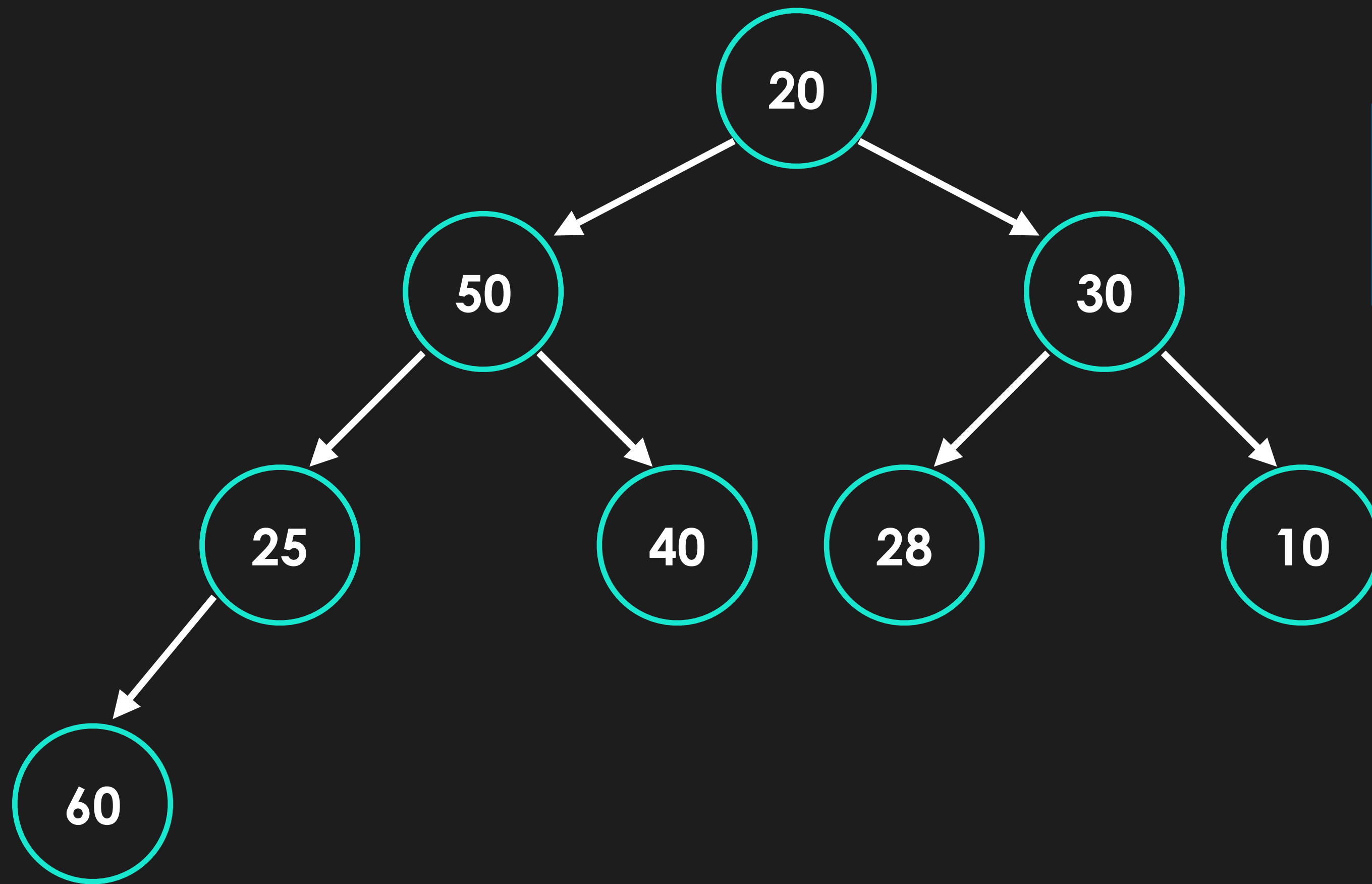
**STEP 2: Swap first and last element**

heap		60	50	30	25	40	28	10	20		
	0	1	2	3	4	5	6	7	8	9	10

getMax()

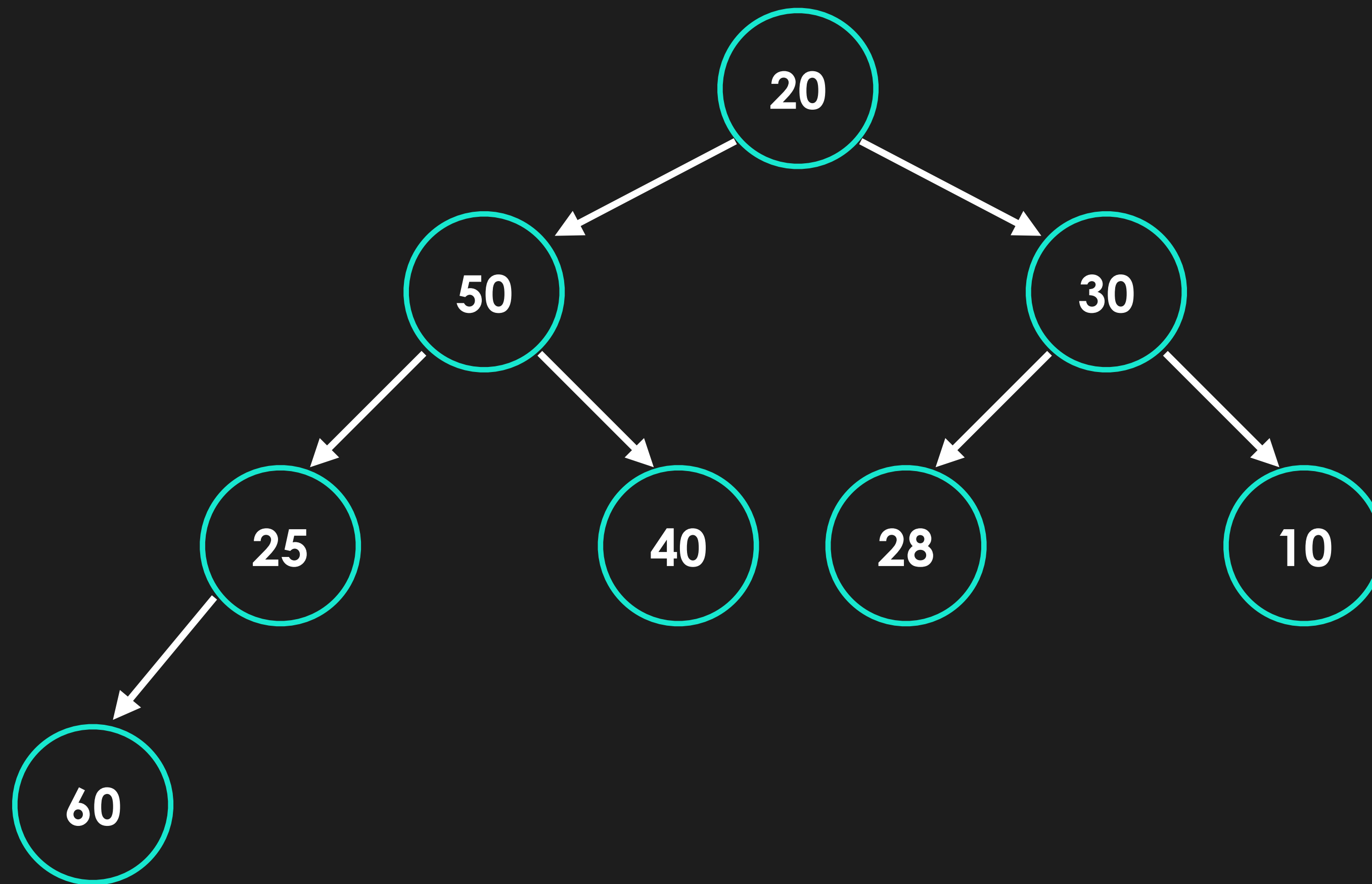
```
swap(self.heap, 1, self.size)
```

**STEP 2: Swap first and last element**



heap										
	20	50	30	25	40	28	10	60		
0	1	2	3	4	5	6	7	8	9	10

getMax()

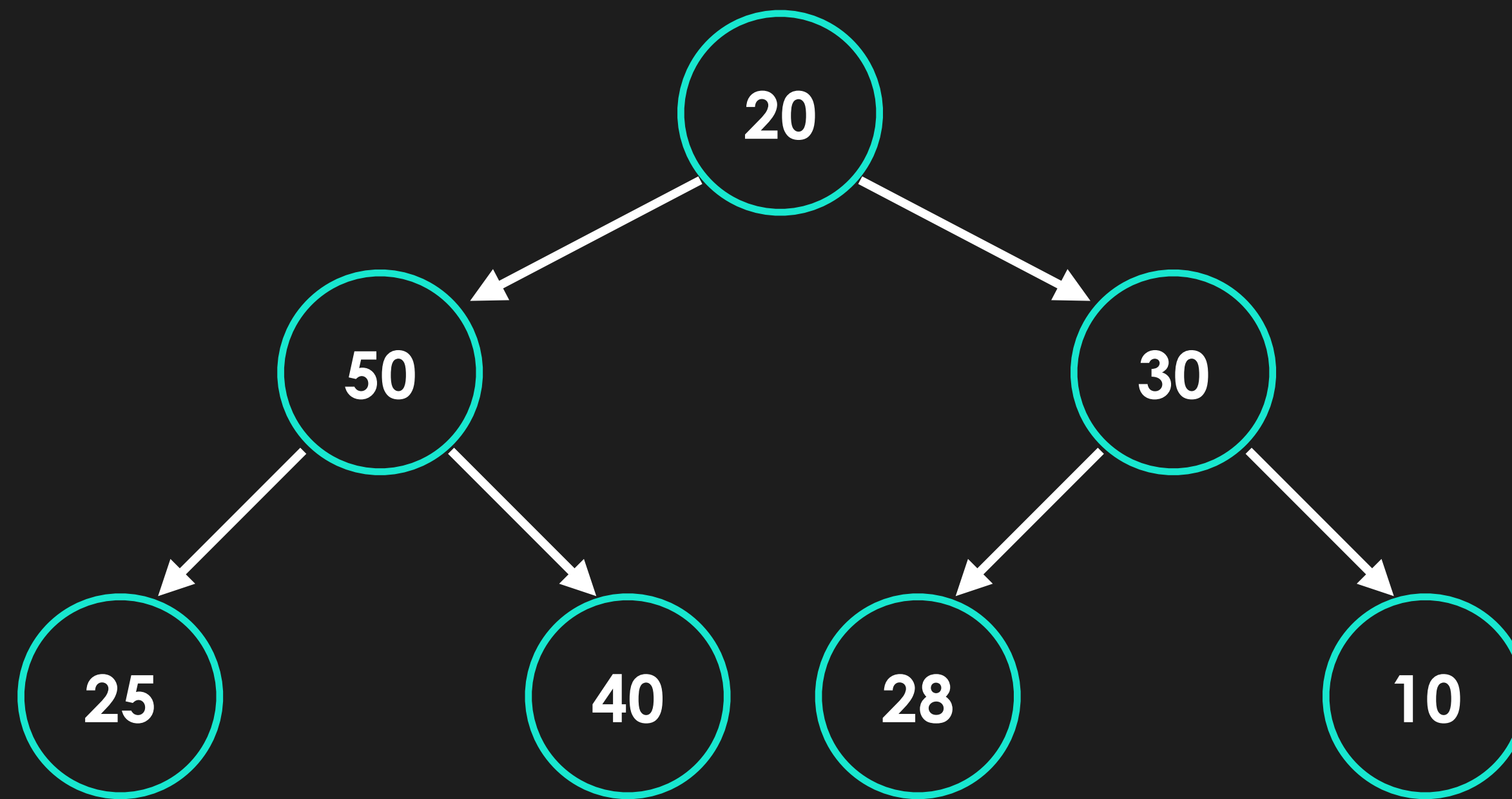


```
self.heap[self.size] = None  
self.size -= 1
```

**STEP 3: Remove last element**

heap		20	50	30	25	40	28	10	60		
	0	1	2	3	4	5	6	7	8	9	10

getMax()

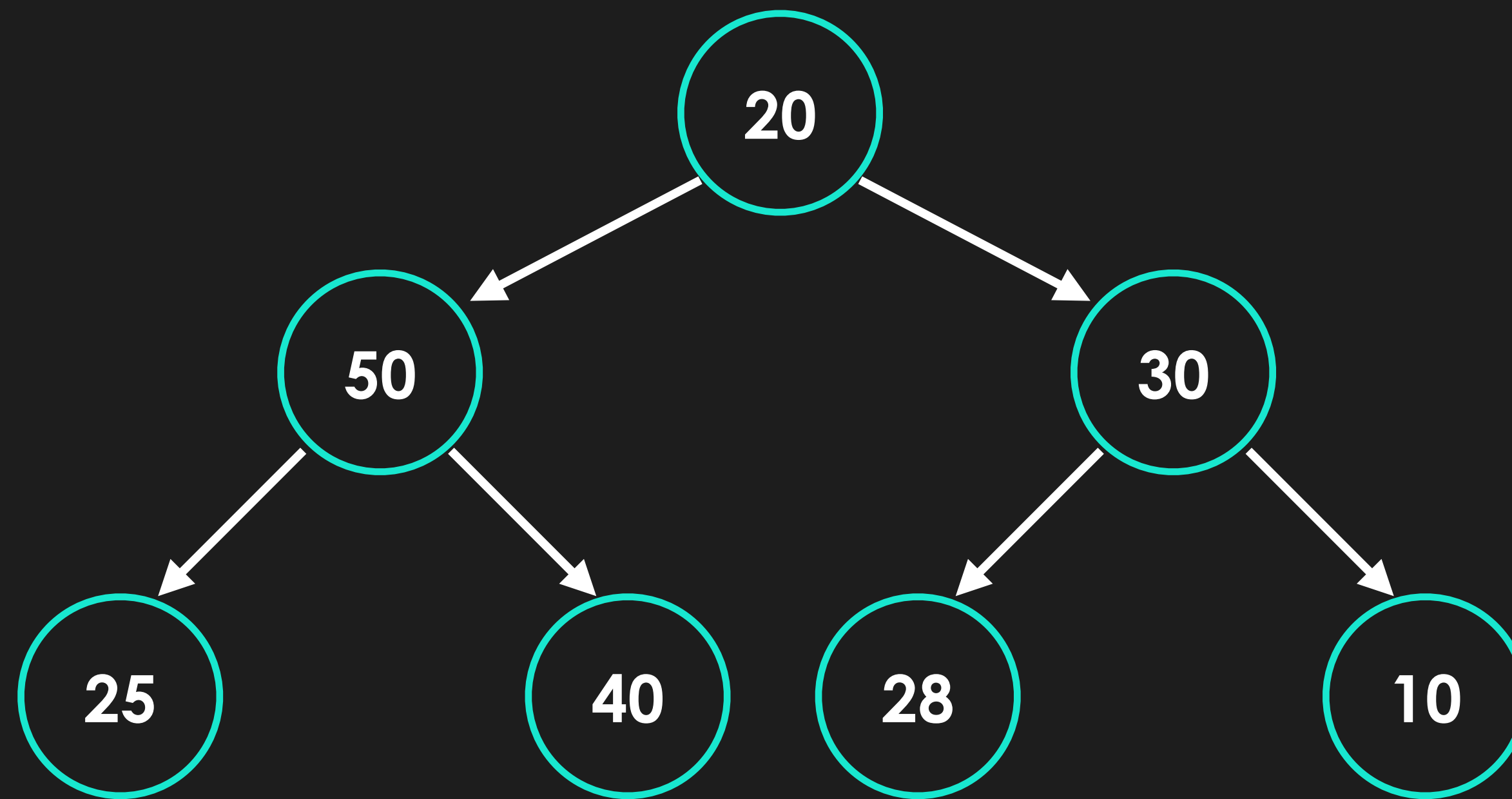


```
self.heap[self.size] = None  
self.size -= 1
```

**STEP 3: Remove last element**



getMax()



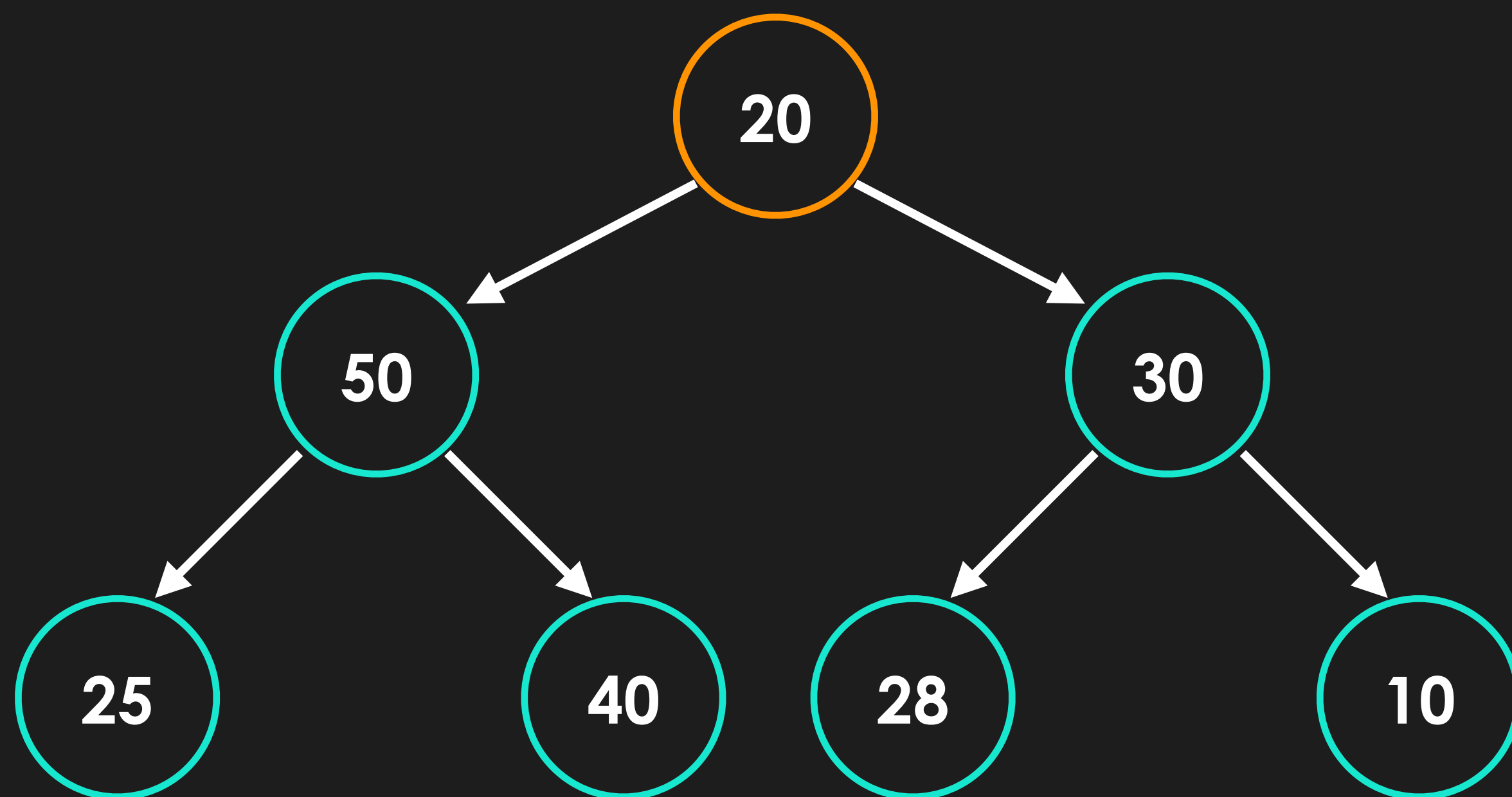
```
self.sink(1)
```

**STEP 4: Sink first element,  
(swap with child node if  
priority is lower)**



**sink**

**sink(1)**

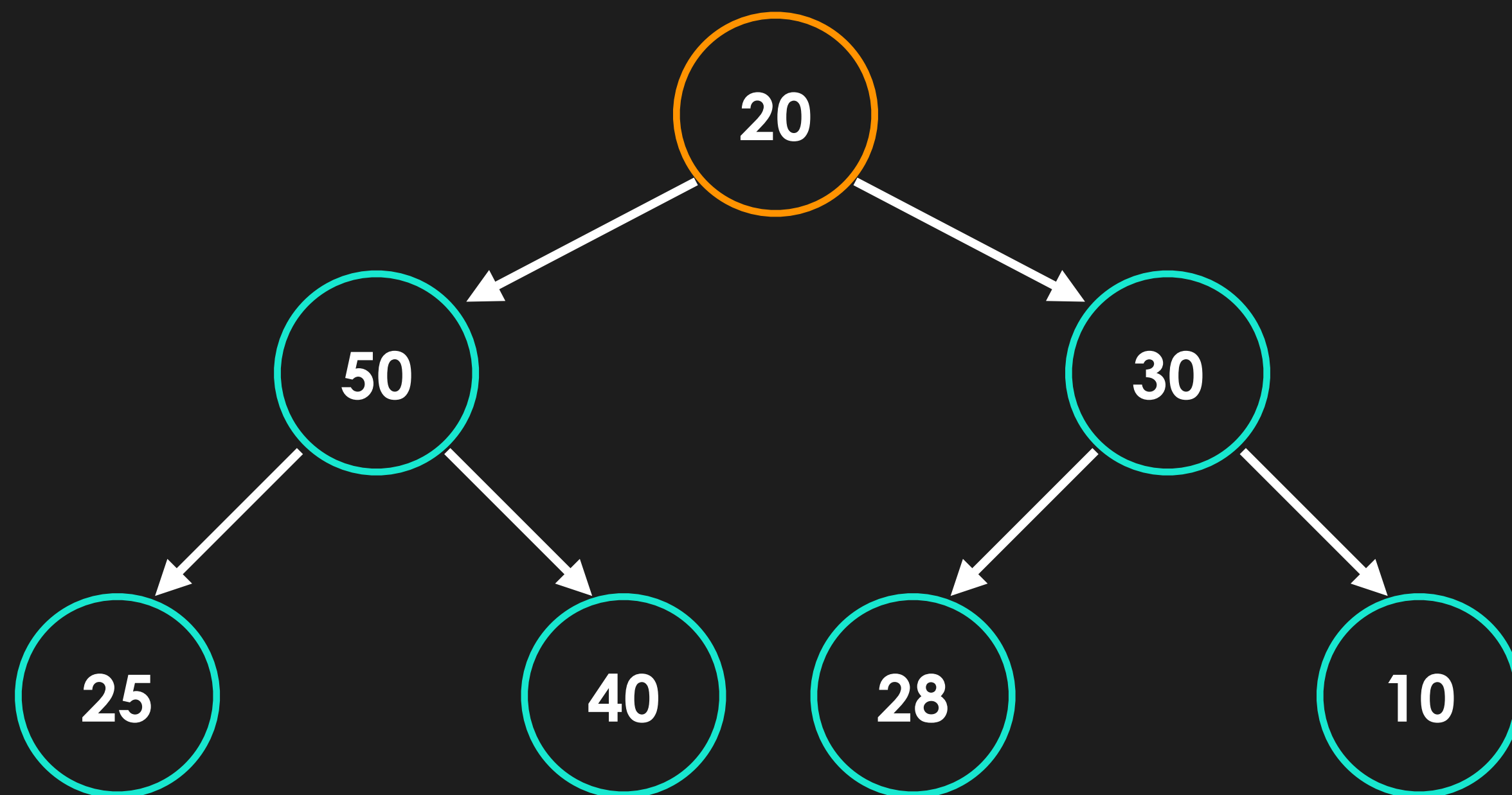


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		20	50	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**



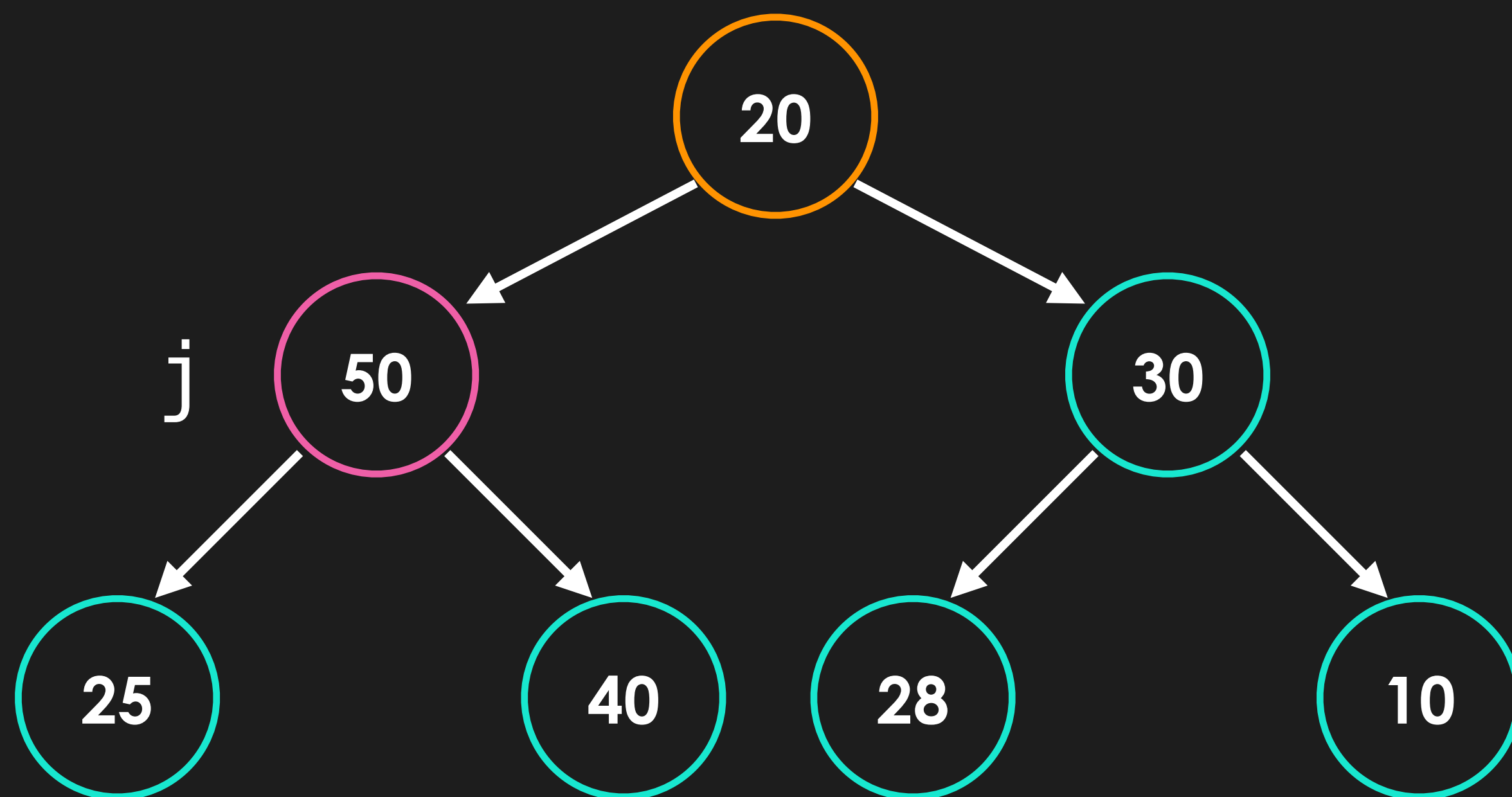
```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		20	50	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10



**sink(1)**

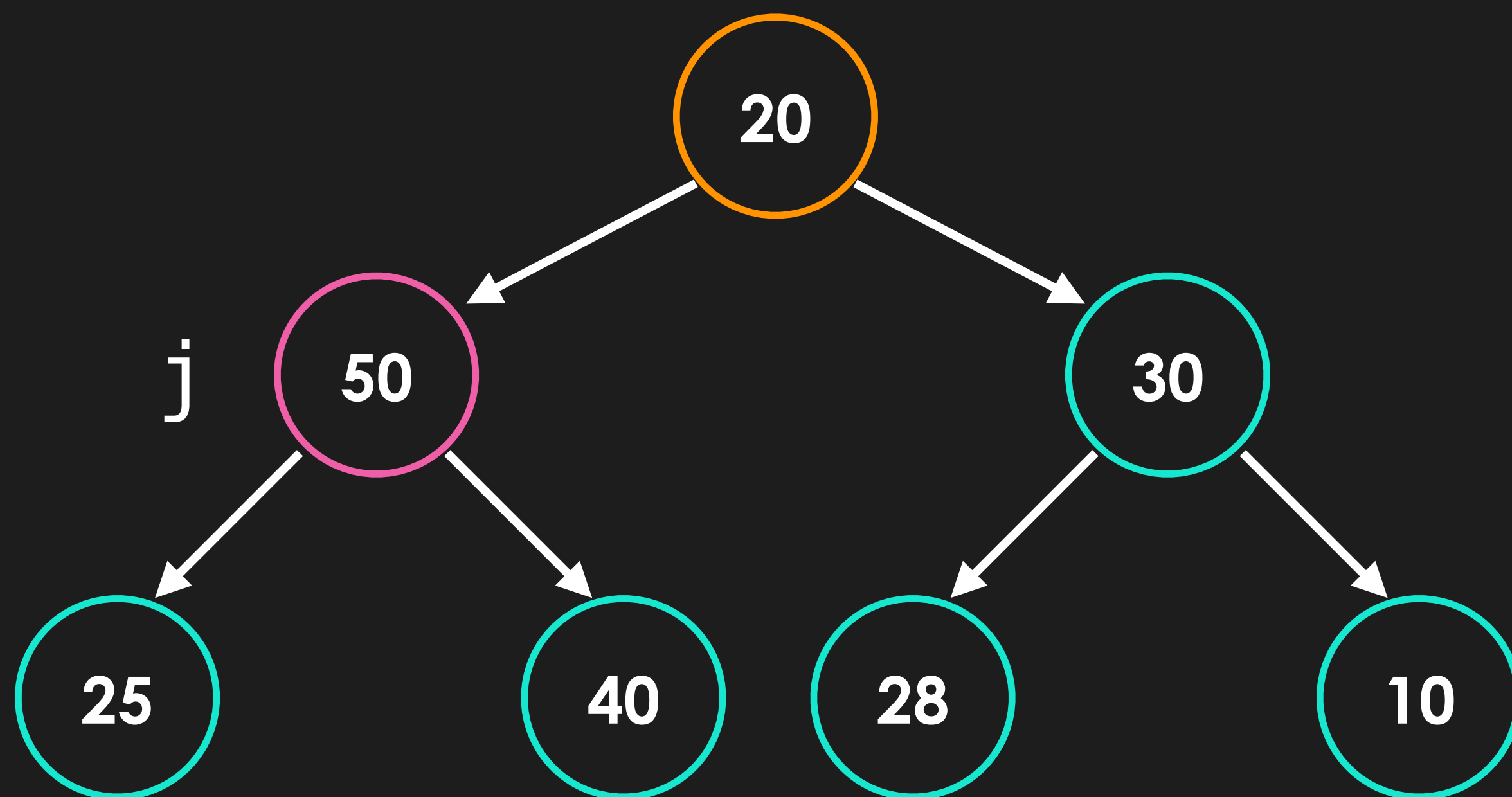


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		20	50	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

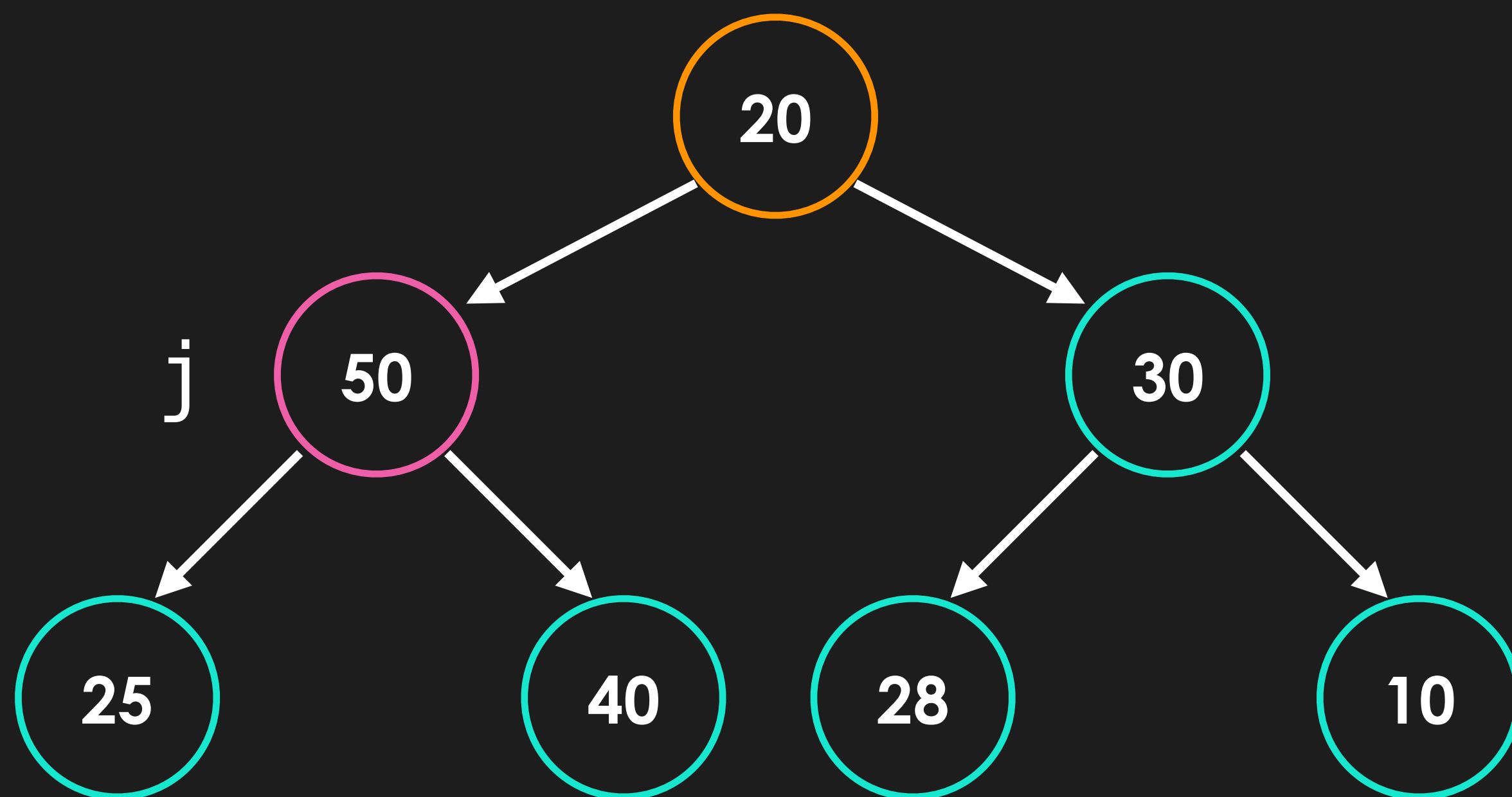


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		20	50	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

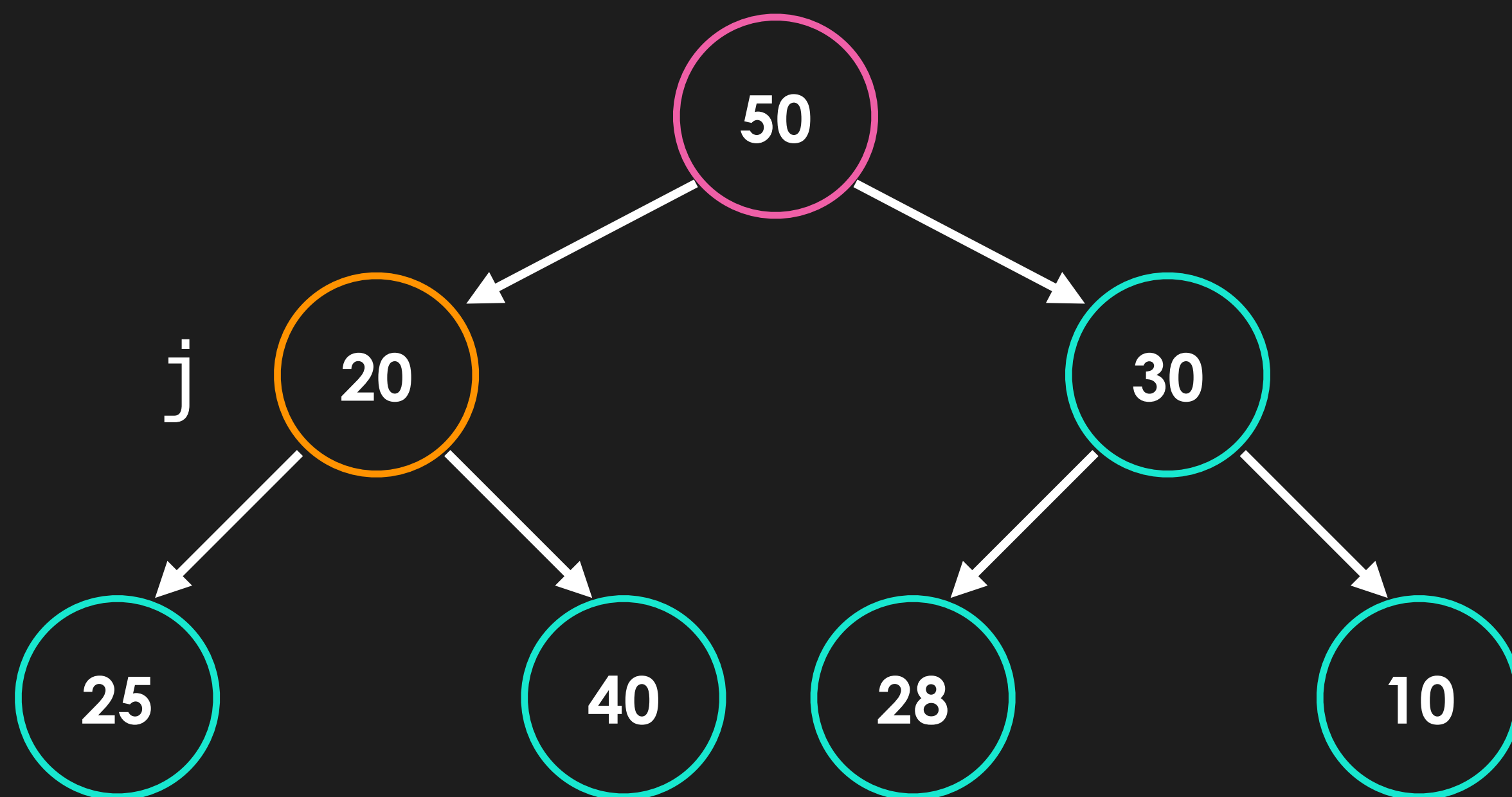


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		20	50	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

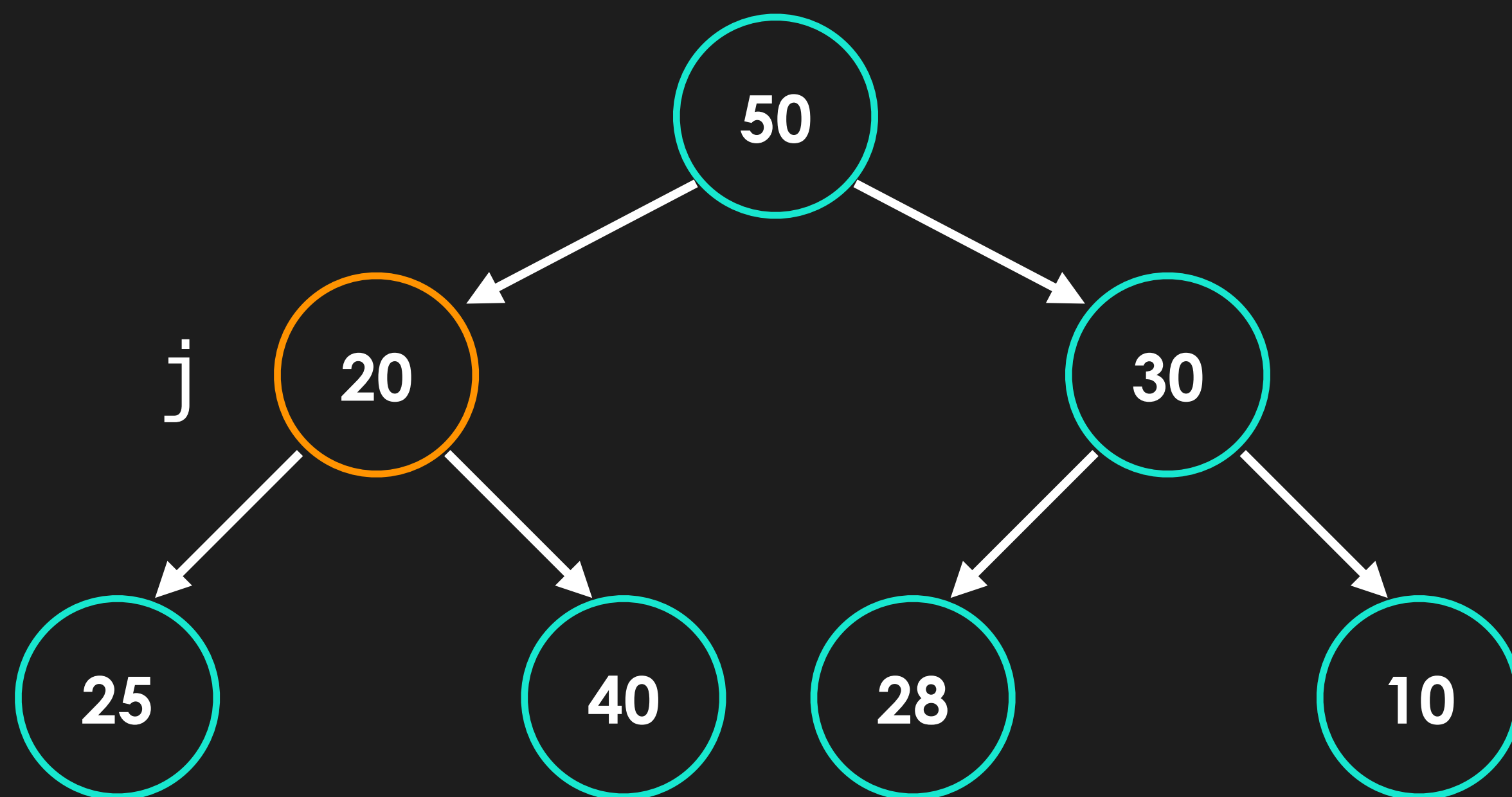


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 1**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

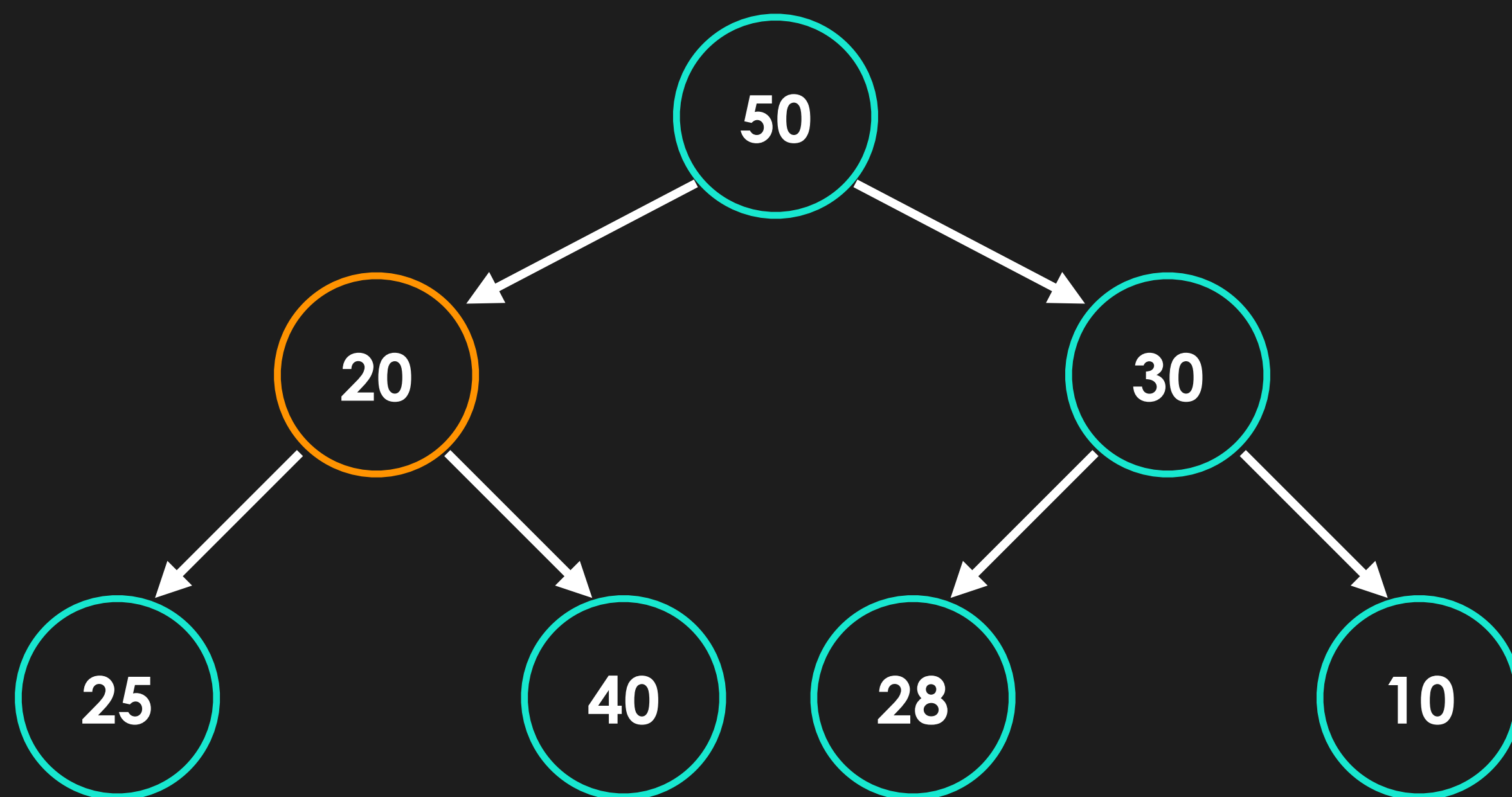


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

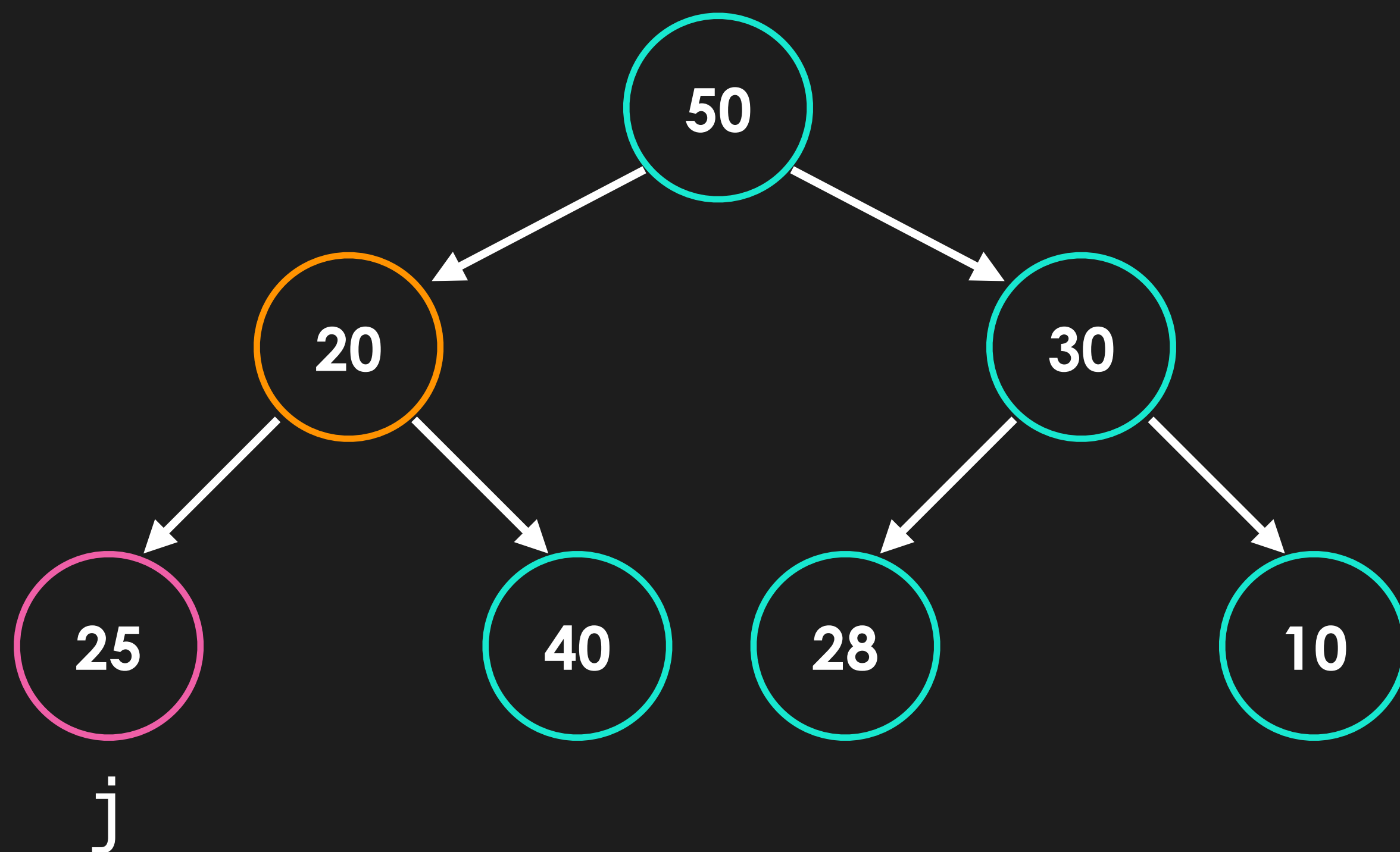


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

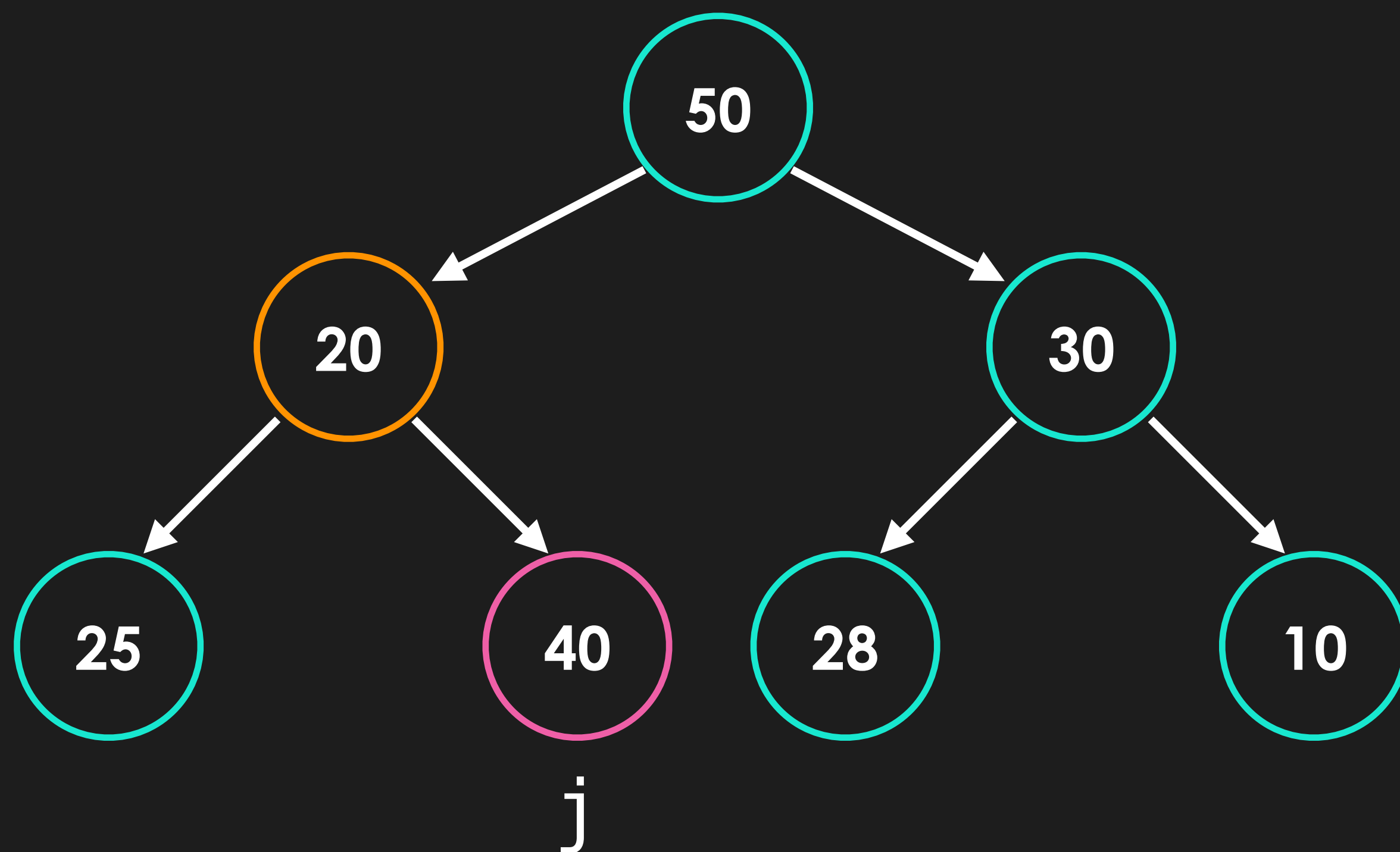


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**



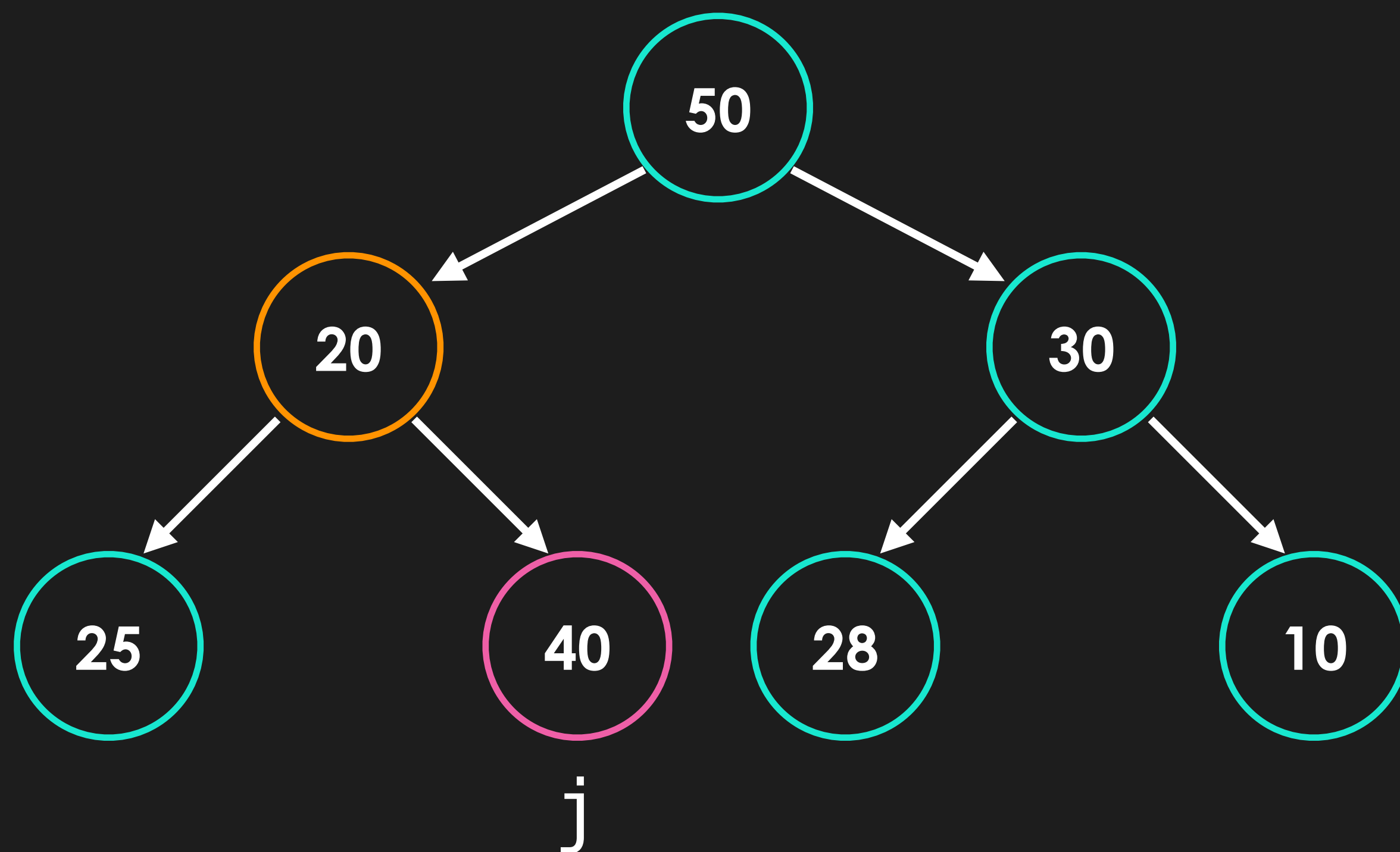
```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10



**sink(1)**

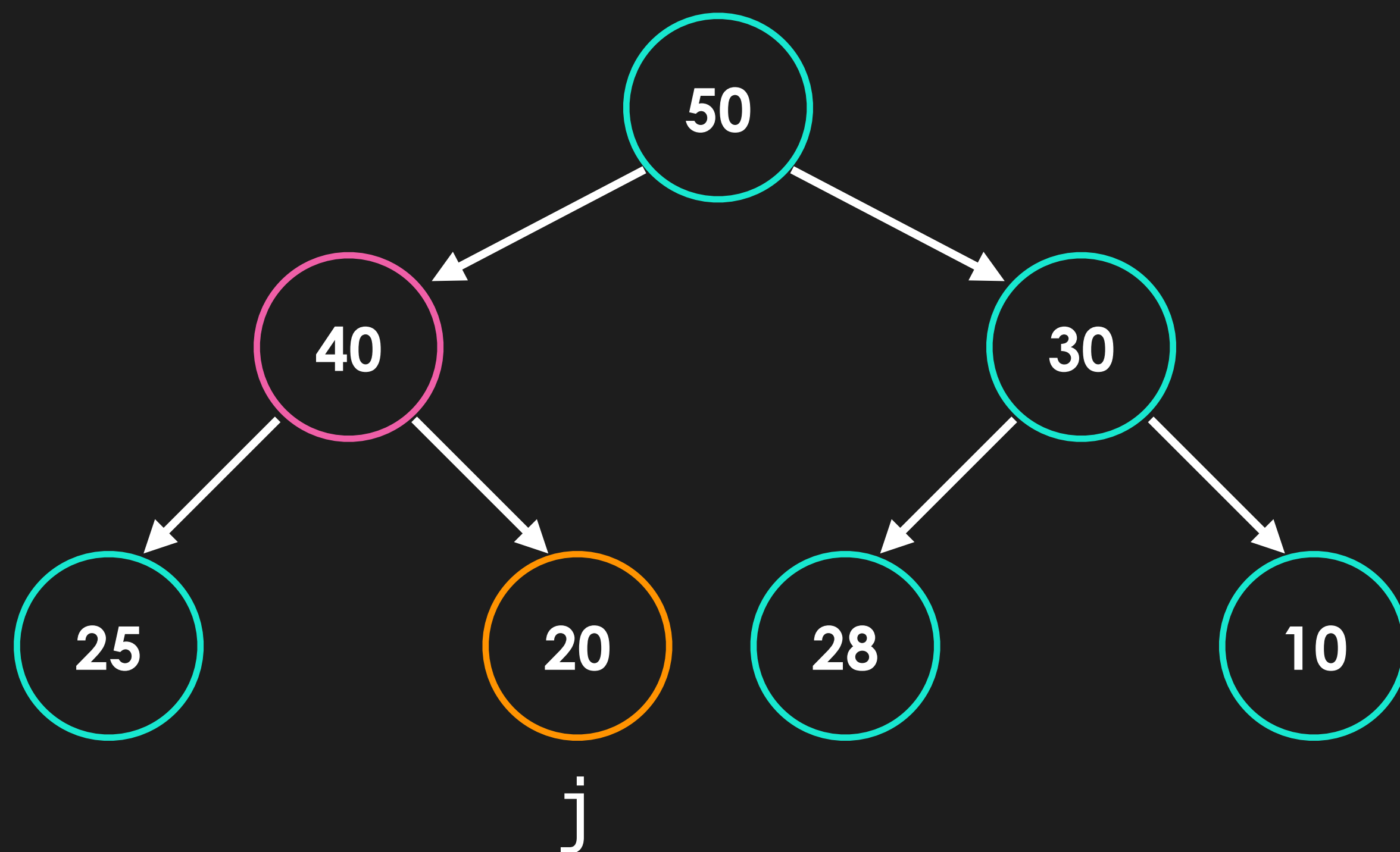


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap		50	20	30	40	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

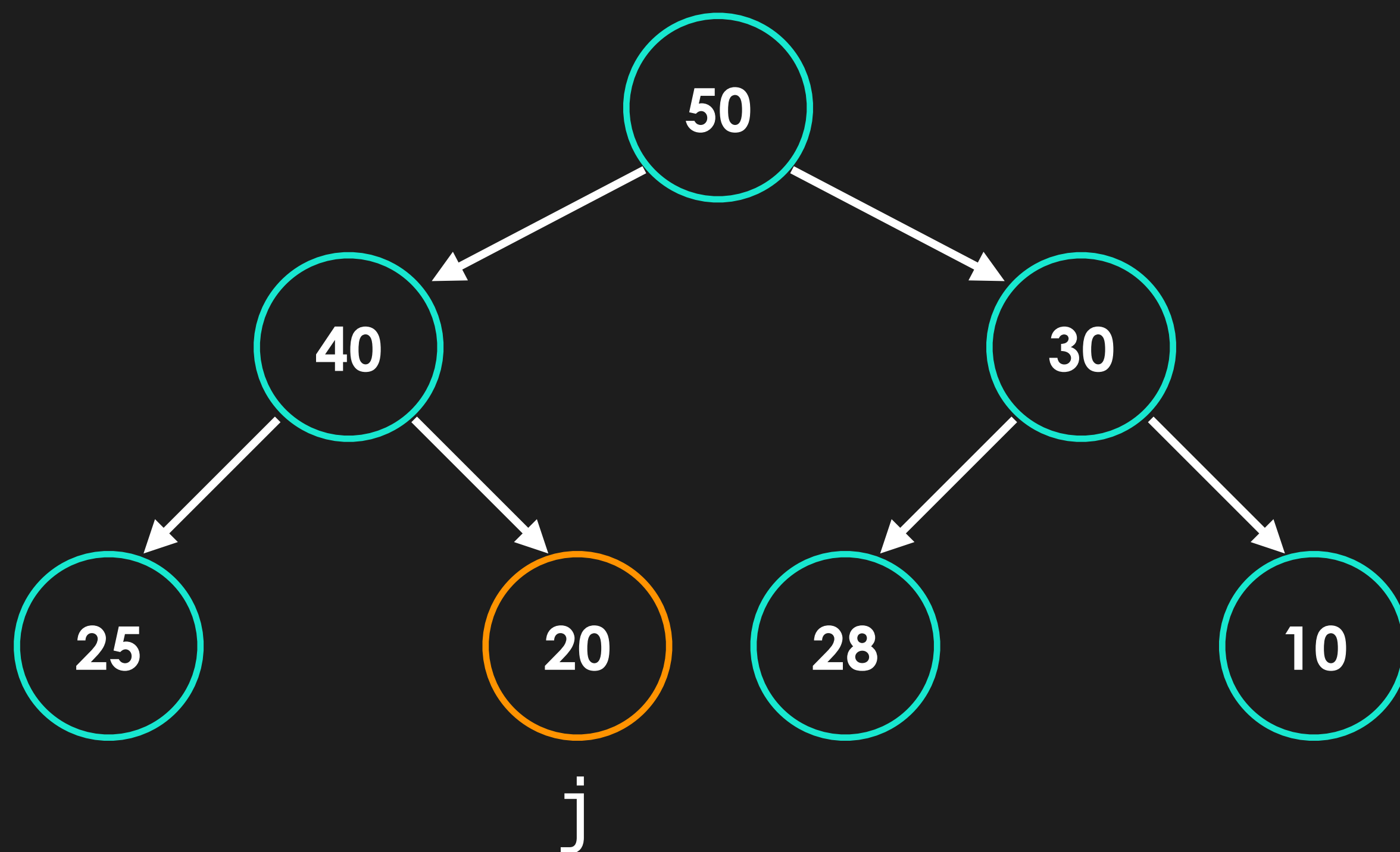


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 2**

heap										
	50	40	30	20	25	28	10			
0	1	2	3	4	5	6	7	8	9	10

**sink(1)**

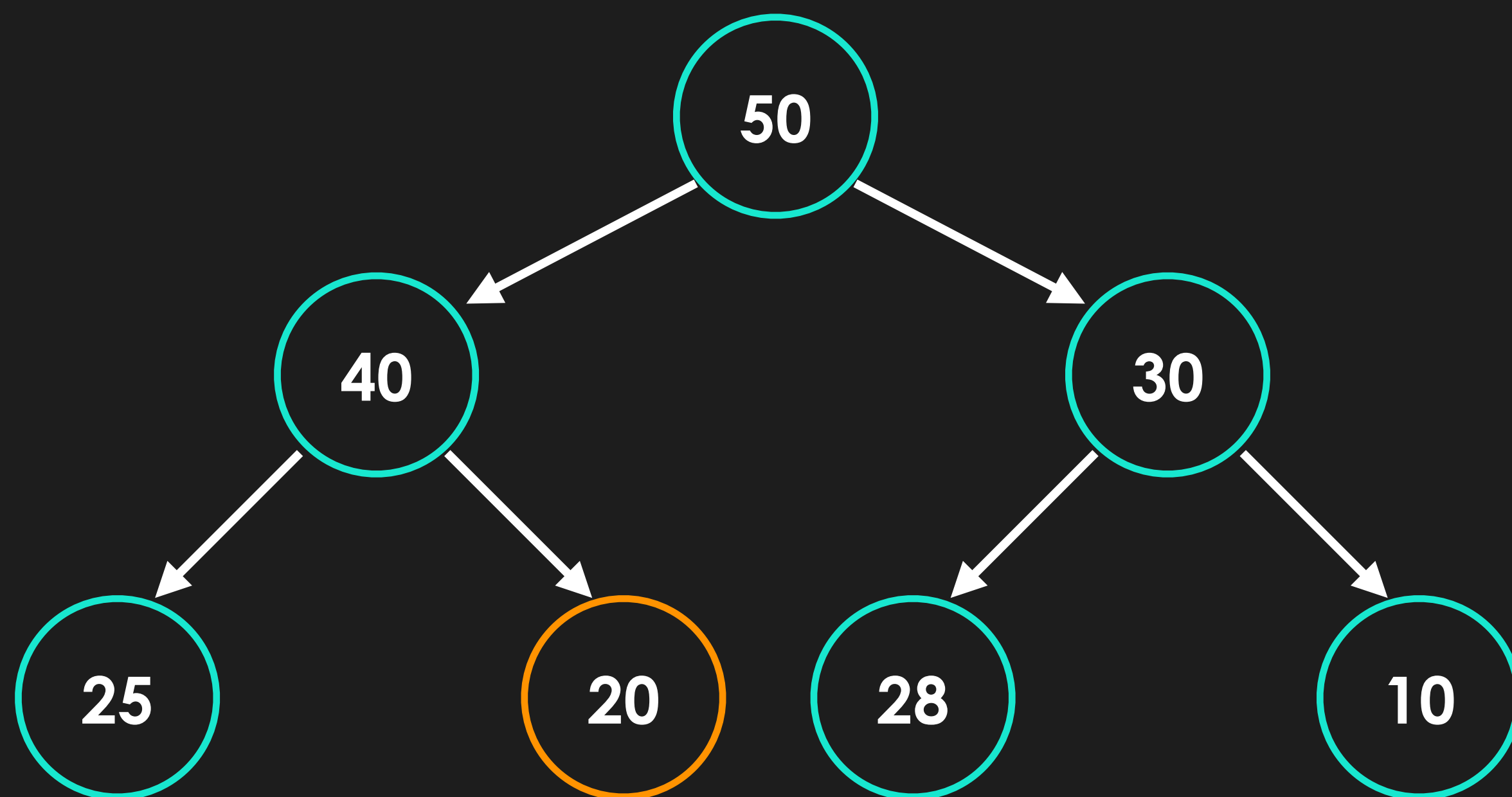


```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
        self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 4**

heap		50	40	30	20	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

**sink(1)**



```
while (2 * index <= self.size):  
    j = left(index)  
  
    if (j < self.size and  
self.greater(right(index), j)):  
        j = right(index)  
  
    if self.greater(index, j):  
        break  
  
    else:  
        swap(self.heap, j, index)  
        index = j
```

**index = 4**

heap		50	40	30	20	25	28	10			
	0	1	2	3	4	5	6	7	8	9	10

# sink

```
def sink(self, index):
    while (2 * index <= self.size):

        # initialize j to be left child
        j = left(index)

        # compare left and right
        if (j < self.size and self.greater(right(index), j)):
            j = right(index)

        if self.greater(index, j):
            break

        else:
            swap(self.heap, j, index)
            index = j

    return
```

# getMax

```
def getMax(self):  
    if self.size == 0:  
        return None  
  
    # SAVE MAX ITEM FOR REMOVAL  
    maxItem = self.heap[1]  
  
    # SWAP MAX ITEM  
    swap(self.heap, self.positions, 1, self.size)  
  
    # REMOVE ITEM  
    self.heap[self.size] = None  
    self.size -= 1  
  
    # SINK FIRST ITEM  
    self.sink(1)  
    return maxItem
```

# Putting it all together

```
pq = MaxHeap(10)
pq.insert(30, "Google")
pq.insert(20, "Amazon")
pq.insert(60, "Apple")
pq.insert(40, "Microsoft")
pq.insert(25, "Netflix")

while pq.size != 0:
    maxItem = pq.getMax()
    print(maxItem.key, maxItem.value)
```



```
pq = MaxHeap(10)
pq.insert(30, "Google")
pq.insert(20, "Amazon")
pq.insert(60, "Apple")
pq.insert(40, "Microsoft")
pq.insert(25, "Netflix")

while pq.size != 0:
    maxItem = pq.getMax()
    print(maxItem.key, maxItem.value)
```

```
Apple 60
Microsoft 40
Google 30
Netflix 25
Amazon 20
```

**Note:** A heap doesn't **necessarily have to contain key-value pairs**. It can contain, for instance, just a **simple array of numbers**. The logic of a heap to extract min / max is essential to many logical processes!

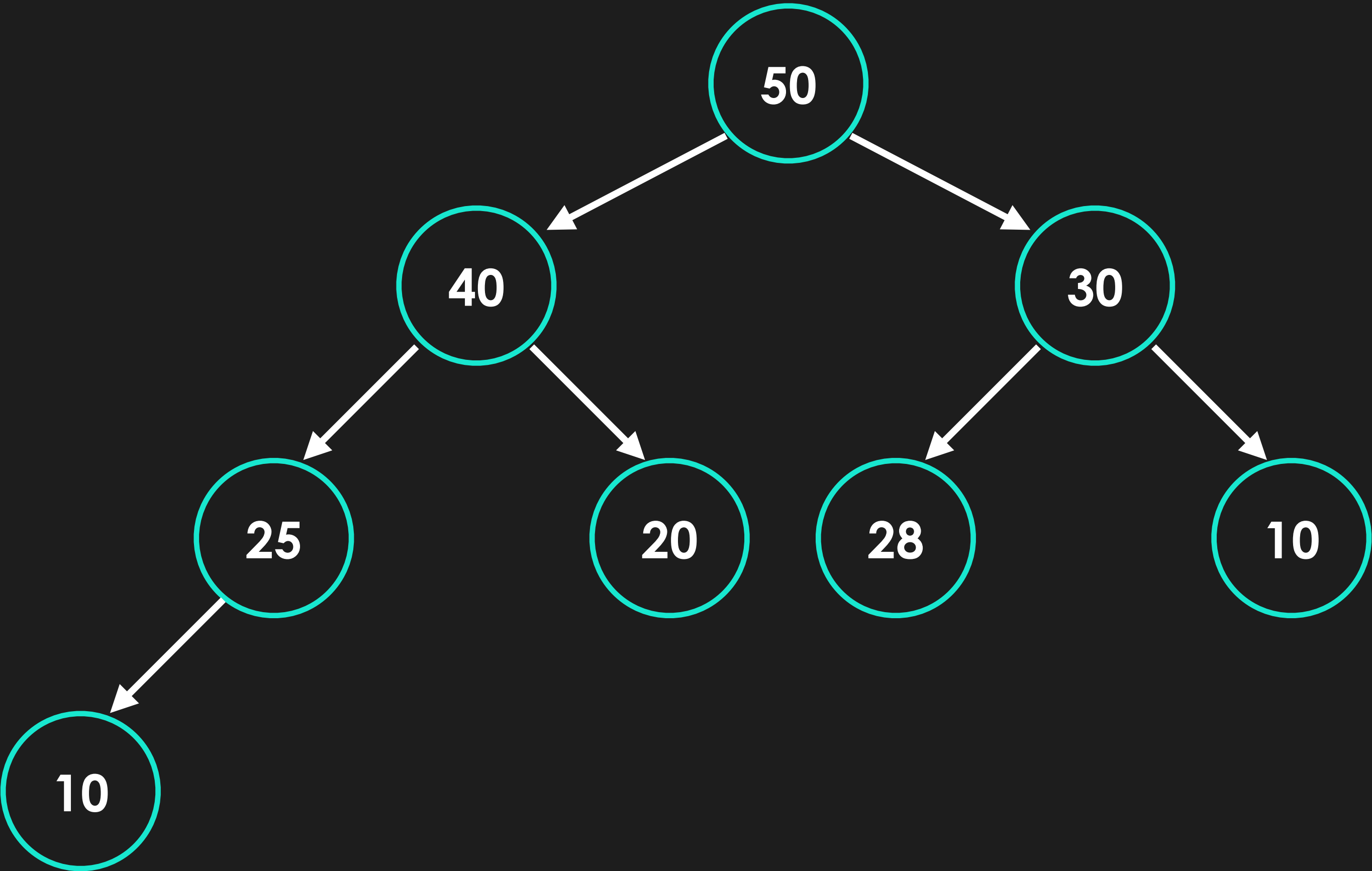
# Lab Session 1

- Implement `min_heap1.py`
- To test, run ``python utils/mh1_test.py``

# Analysis of Heap Operations

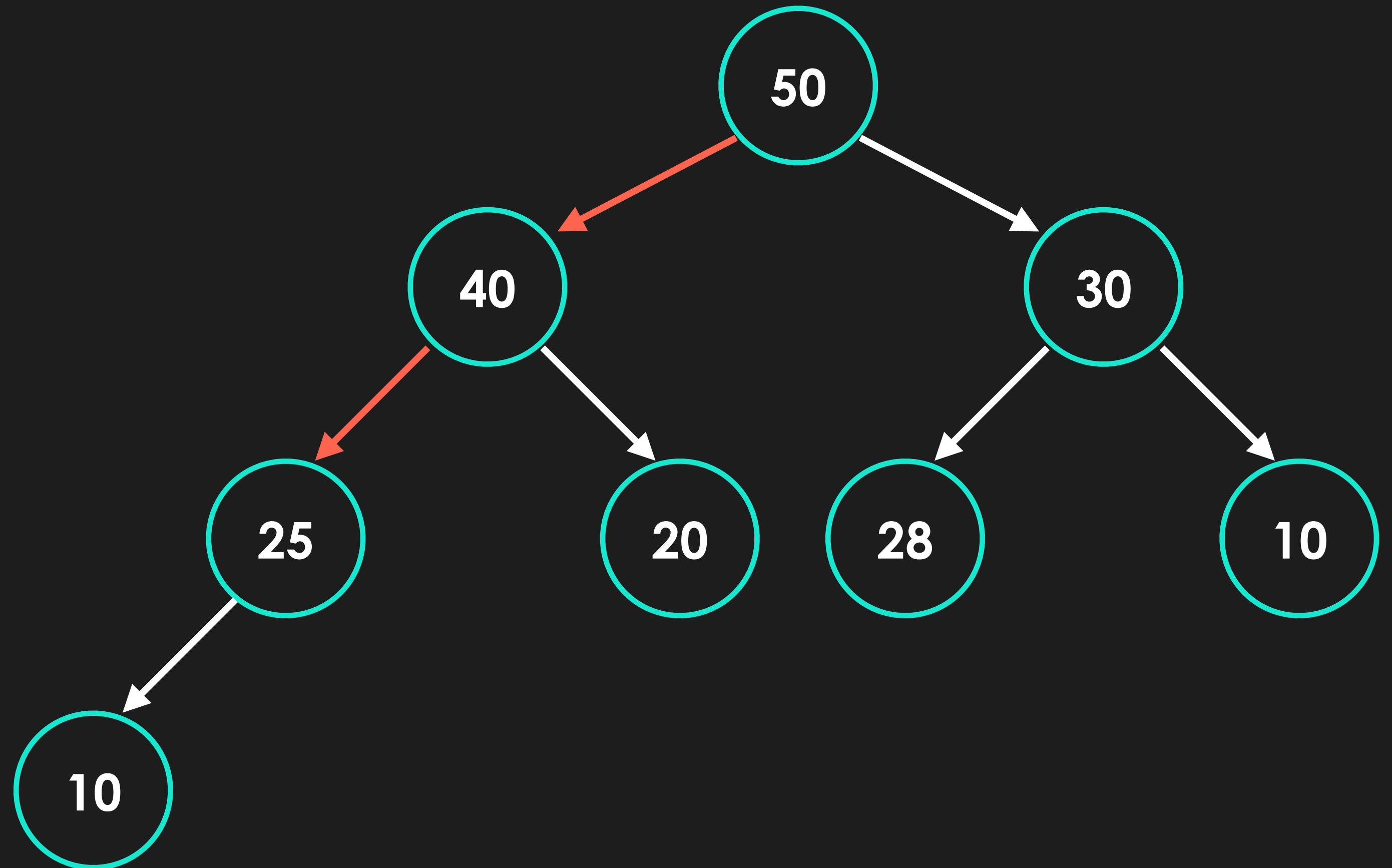
# Tree Height

# Maximum Tree Height



Maximum Tree Height

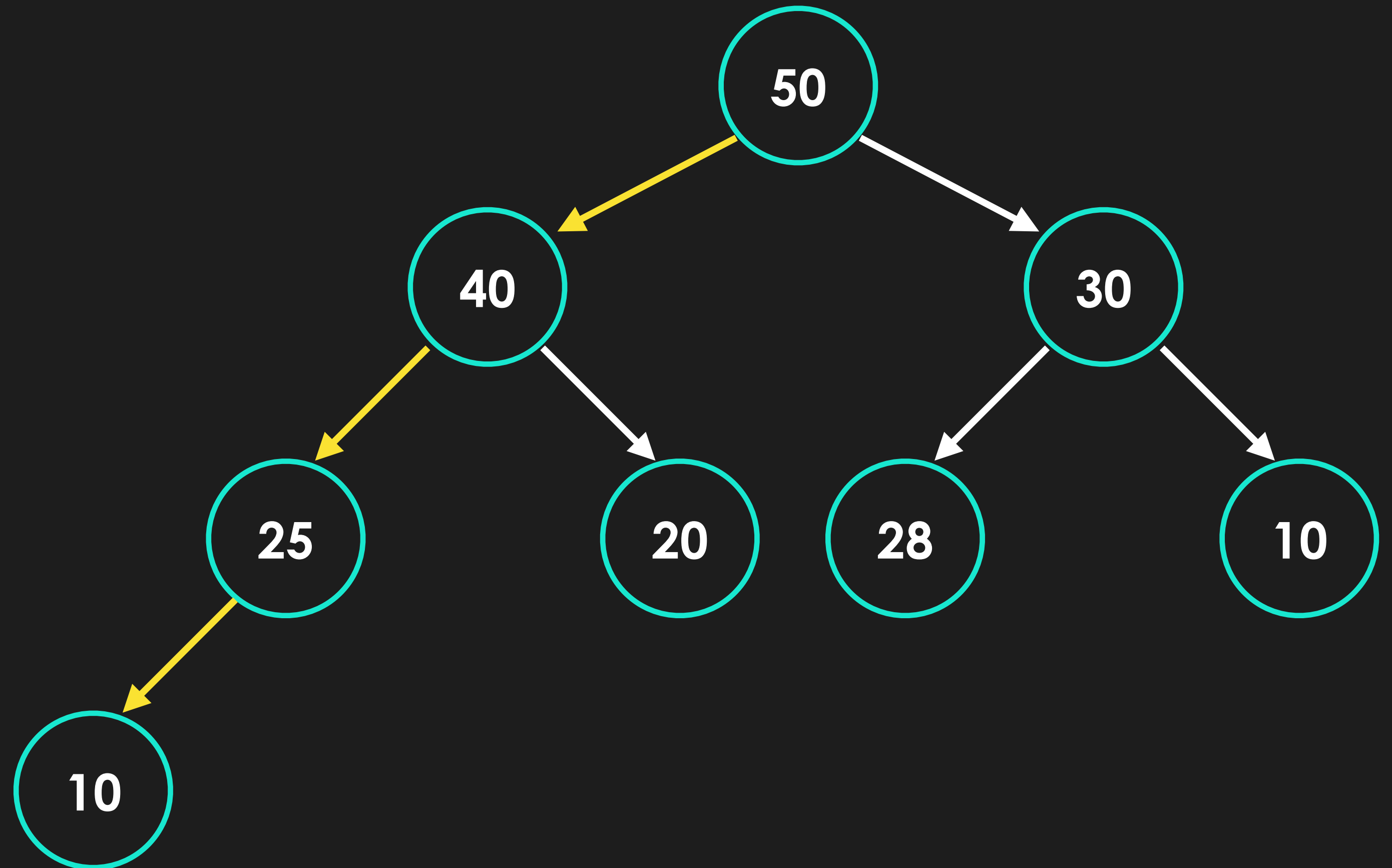
4 nodes: 2



## Maximum Tree Height

4 nodes: 2

8 nodes: 3



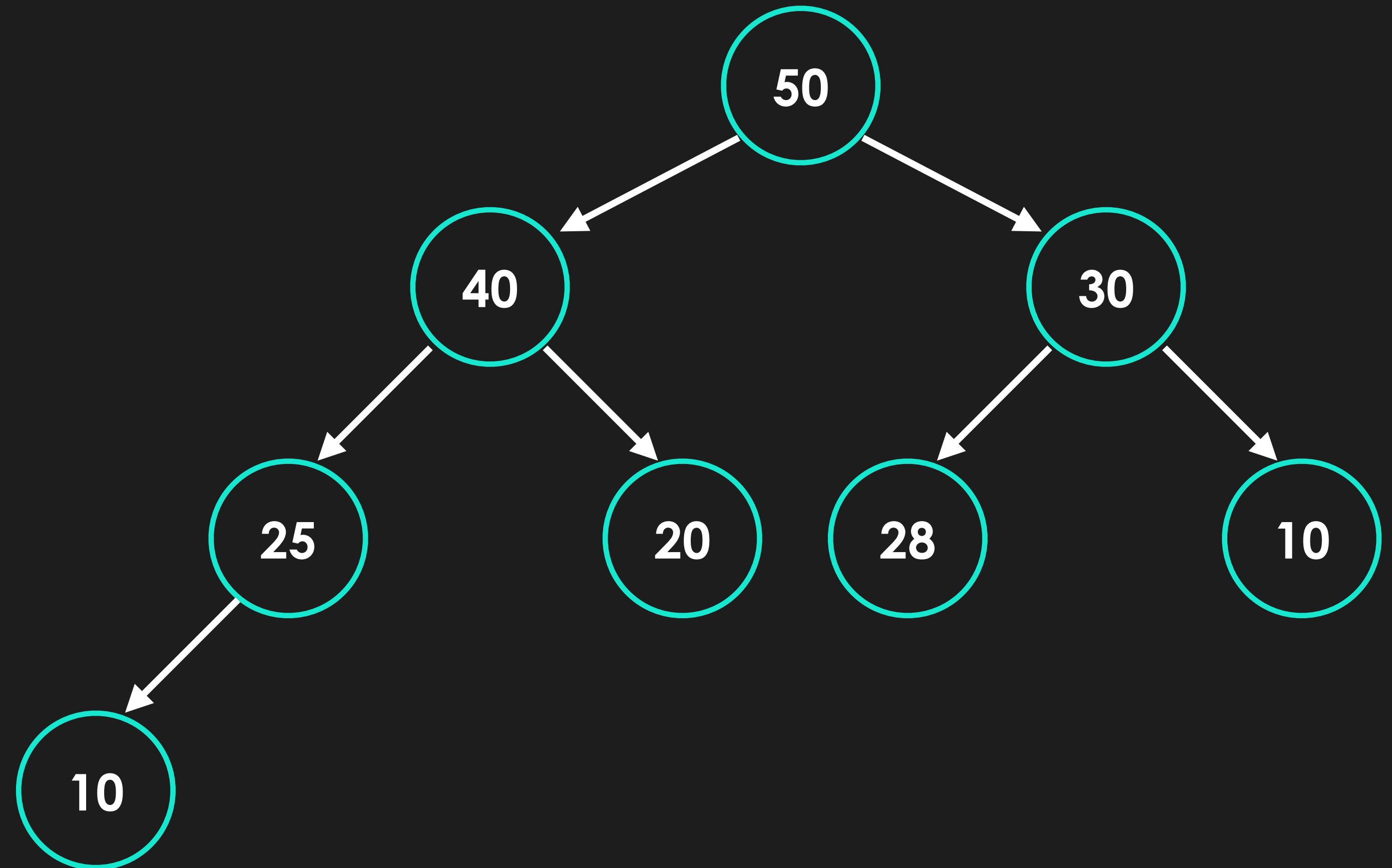


## Maximum Tree Height

4 nodes: 2

8 nodes: 3

N nodes:  $\log N$  (base 2)



## Time complexity for sink & swim

- Both sink and swim have worst case time complexity of  $O(\log N)$
- This is because at most  $\log N$  nodes are visited!

## Time complexity for heap insertion

- Assuming no **resize**, adding an extra item will take **constant time**, and calling **swim** on the new item will take **logN**. Therefore, heap insertion has **logN** worst case time complexity!

## Time complexity for heap extraction

- For extraction, swapping the first and last element takes **constant time**. Performing **sink** will take  **$\log N$**  time. Therefore, heap extraction has worst case time complexity of  **$\log N$**

# Comparison of Priority Queue Data Structures

	Worst Case		Average Case	
	Binary Heap	List	Binary Heap	List
Insert	$\log N$	1	$\log N$	1
Extract	$\log N$	N	$\log N$	N

**Note:** If your application will have a huge number of inserts but very few removals of highest priority, lists / arrays would be the way to go because you can insert in **constant time**

# MinHeap

**Imagine if now instead of tracking returns, we want to track risk, and therefore keep track of investments with the lowest risk**

Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%



**We can use a min heap, and to construct one, all we have to make is one small change:**

```
def greater(self, index1, index2):  
    if self.heap[index1].value > self.heap[index2].value:  
        return True  
    else:  
        return False
```

We can use a min heap, and to construct one, all we have to make is one small change:

```
def greater(self, index1, index2):  
    if self.heap[index1].value < self.heap[index2].value:  
        return True  
    else:  
        return False
```

Our comparisons now treat lower values with **higher priority!**

```
pq = MaxHeap(10)
pq.insert(30, "Google")
pq.insert(20, "Amazon")
pq.insert(60, "Apple")
pq.insert(40, "Microsoft")
pq.insert(25, "Netflix")

while pq.size != 0:
    maxItem = pq.getMax()
    print(maxItem.key, maxItem.value)
```

```
pq = MaxHeap(10)
pq.insert(30, "Google")
pq.insert(20, "Amazon")
pq.insert(60, "Apple")
pq.insert(40, "Microsoft")
pq.insert(25, "Netflix")

while pq.size != 0:
    maxItem = pq.getMax()
    print(maxItem.key, maxItem.value)
```

```
Amazon 20
Netflix 25
Google 30
Microsoft 40
Apple 60
```

# Applications of Priority Queues

# Applications of Priority Queues

1. **Rank** (Get kth largest element in a list)
2. **Greedy Algorithms** (E.g. Dijkstra's Shortest Path)
3. **Huffman Compression**
4. **Stock Exchange Matching** (match buyers to sellers, highest bid)

# Priority Queues with changing values

# Priority Queues with changing values

Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%



Google	30%
Amazon	20%
Apple	60%
Microsoft	10%
Netflix	90%



# Priority Queues with changing values

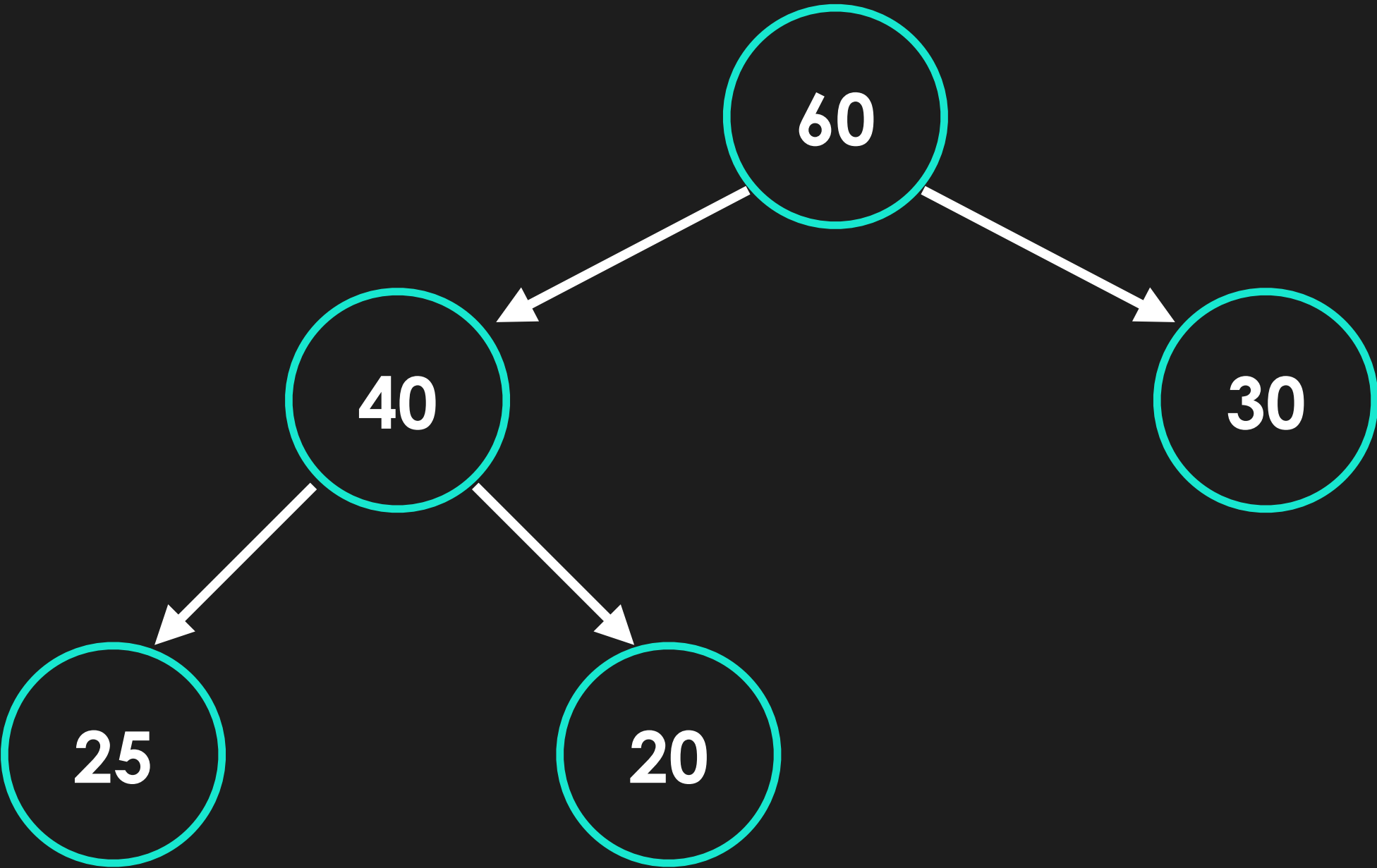
Google	30%
Amazon	20%
Apple	60%
Microsoft	40%
Netflix	25%



Google	30%
Amazon	20%
Apple	60%
Microsoft	10%
Netflix	90%

If our keys' values change, how can we support this in a Heap structure?

We can create a dictionaries (positions), to store the index of each key in the heap



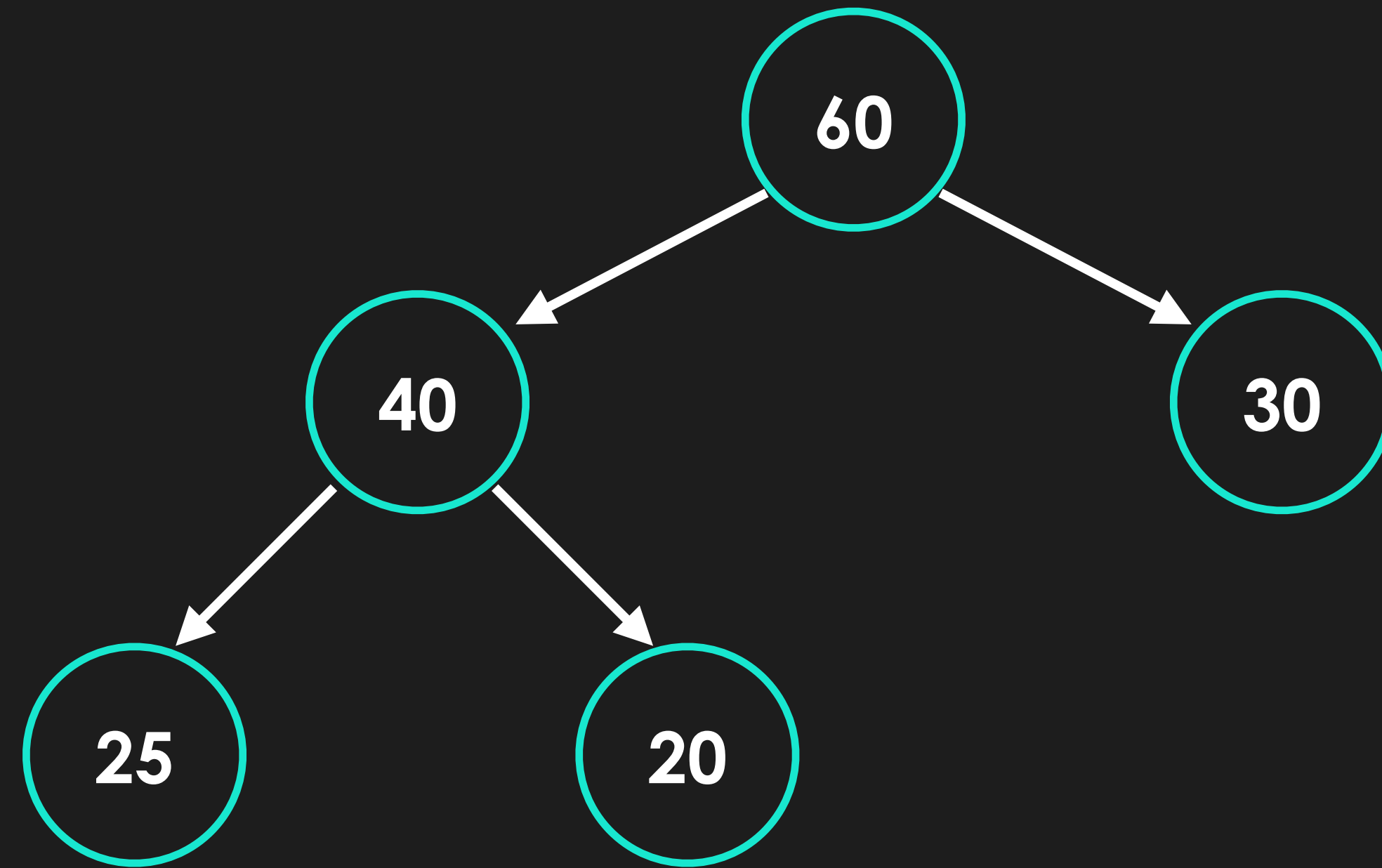
**heap**

	60	40	30	20	25
0	1	2	3	4	5

**positions**

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	5
"Amazon"	4

## STEP 1: Check if key exists



heap

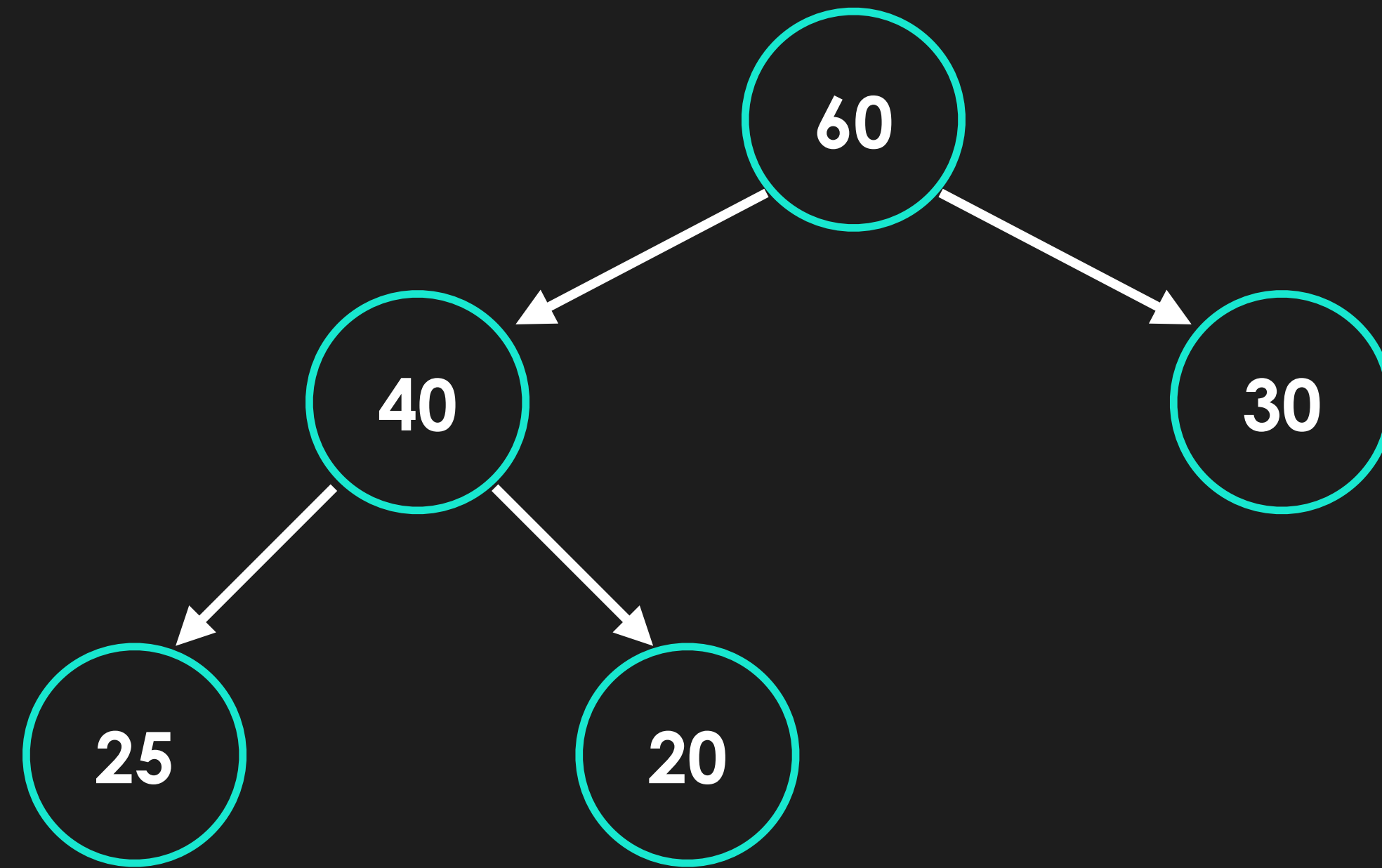
	60	40	30	25	20
0	1	2	3	4	5

```
pq.insert("Microsoft", 10)
```

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	5
"Amazon"	4

## STEP 1: Check if key exists



heap

	60	40	30	25	20
0	1	2	3	4	5

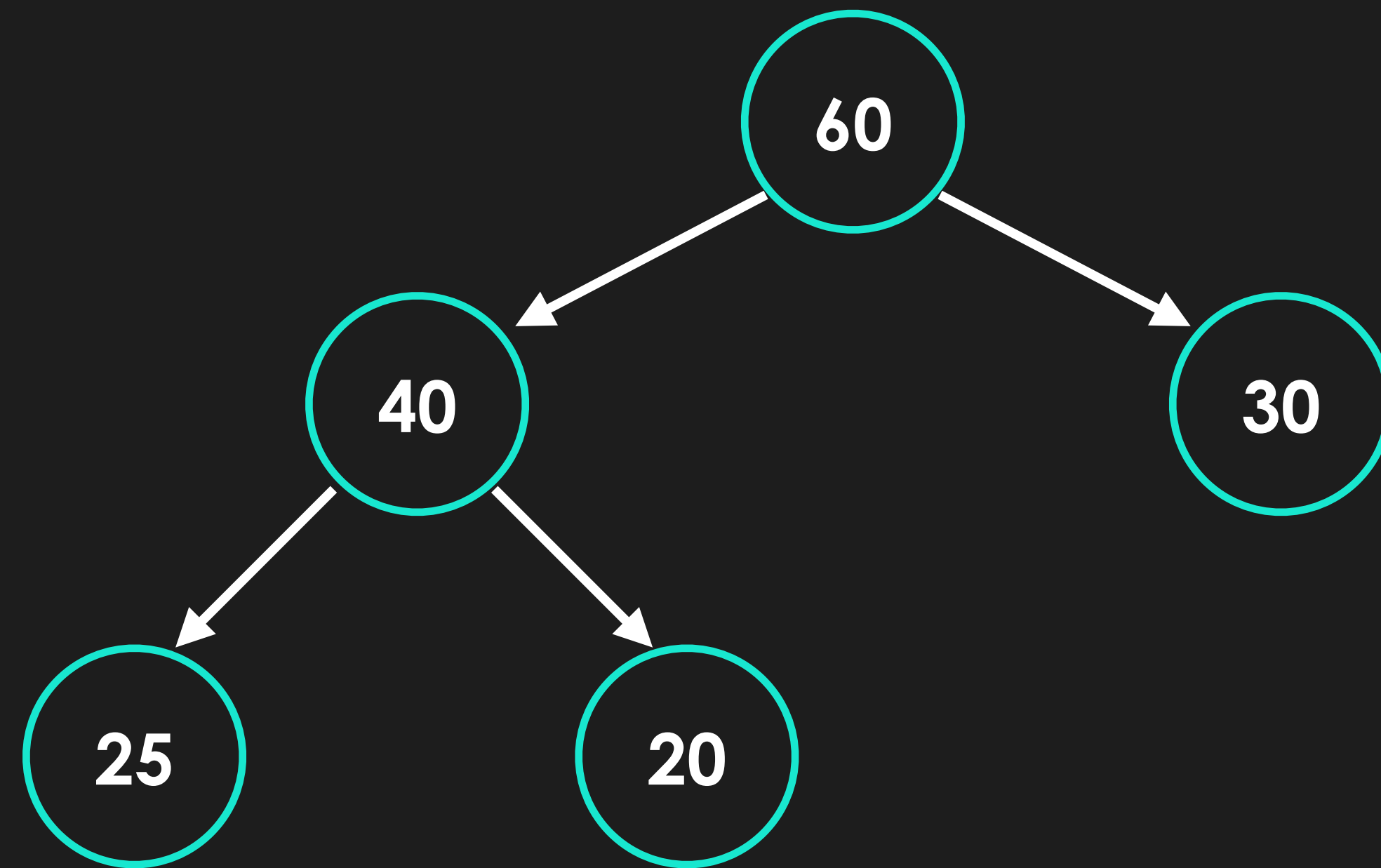
```
pq.insert("Microsoft", 10)
```

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5

## STEP 2: Get index based on positions dict

```
pq.insert("Microsoft", 10)
```



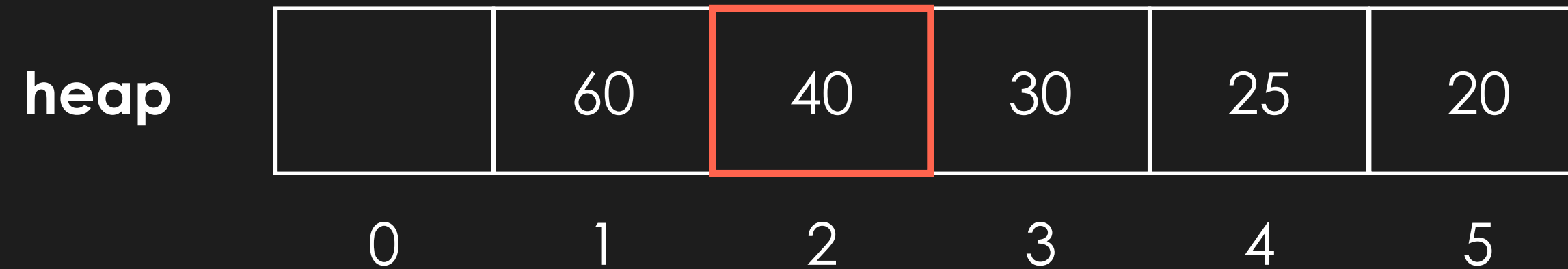
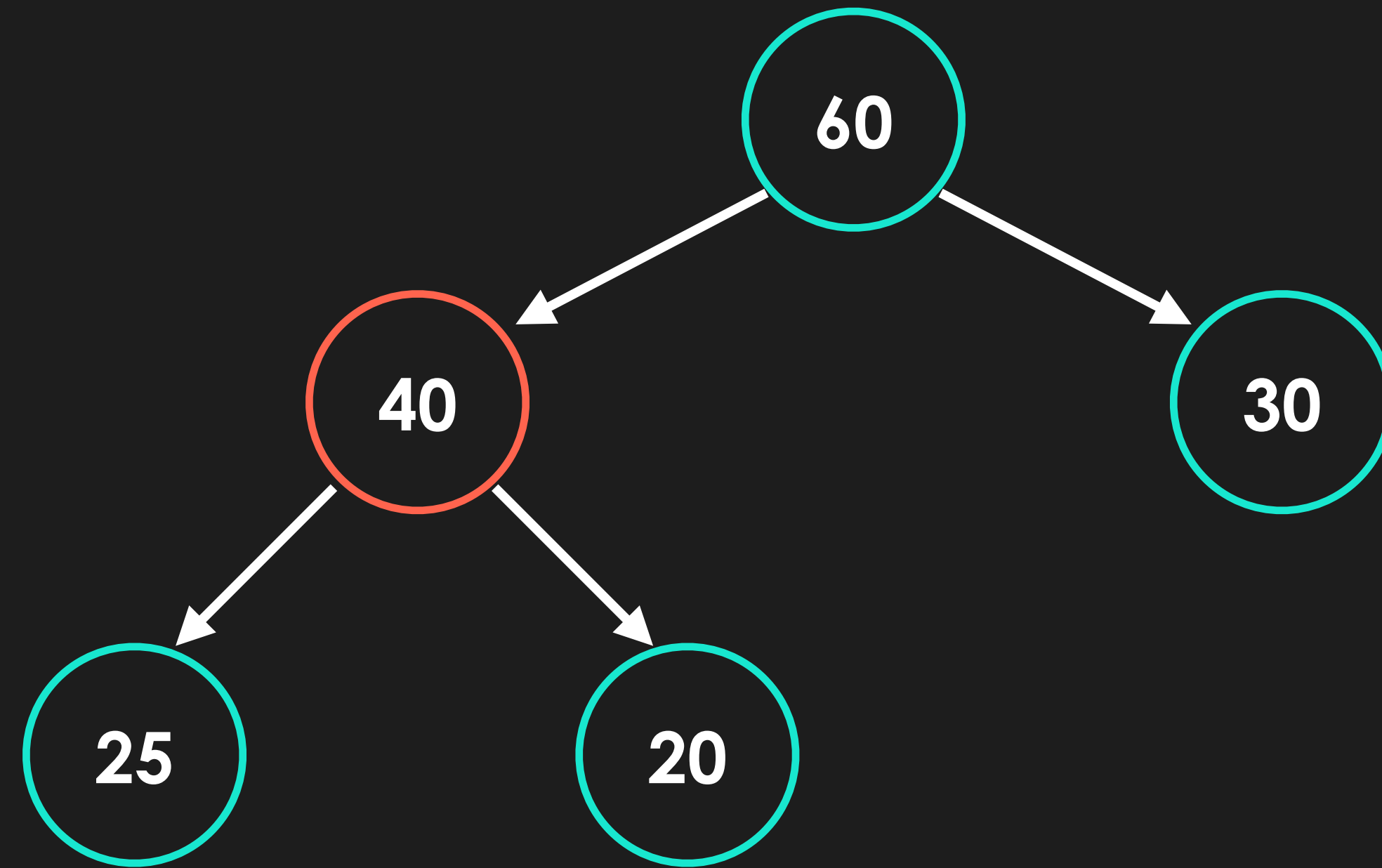
heap		60	40	30	25	20
	0	1	2	3	4	5

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5

## STEP 2: Get index based on positions dict

```
pq.insert("Microsoft", 10)
```

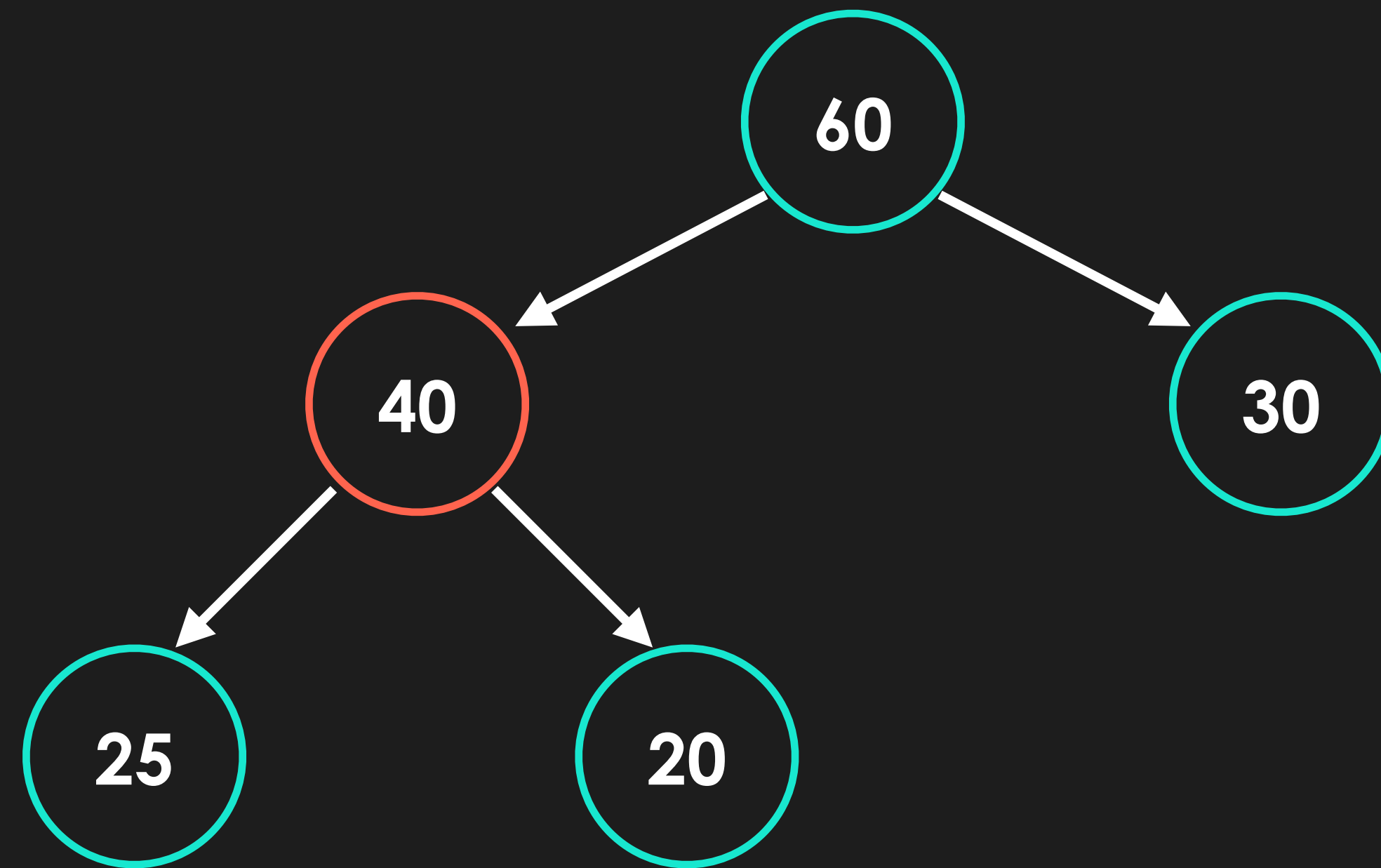


positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5

## STEP 3: Assign new value to item

```
pq.insert("Microsoft", 10)
```



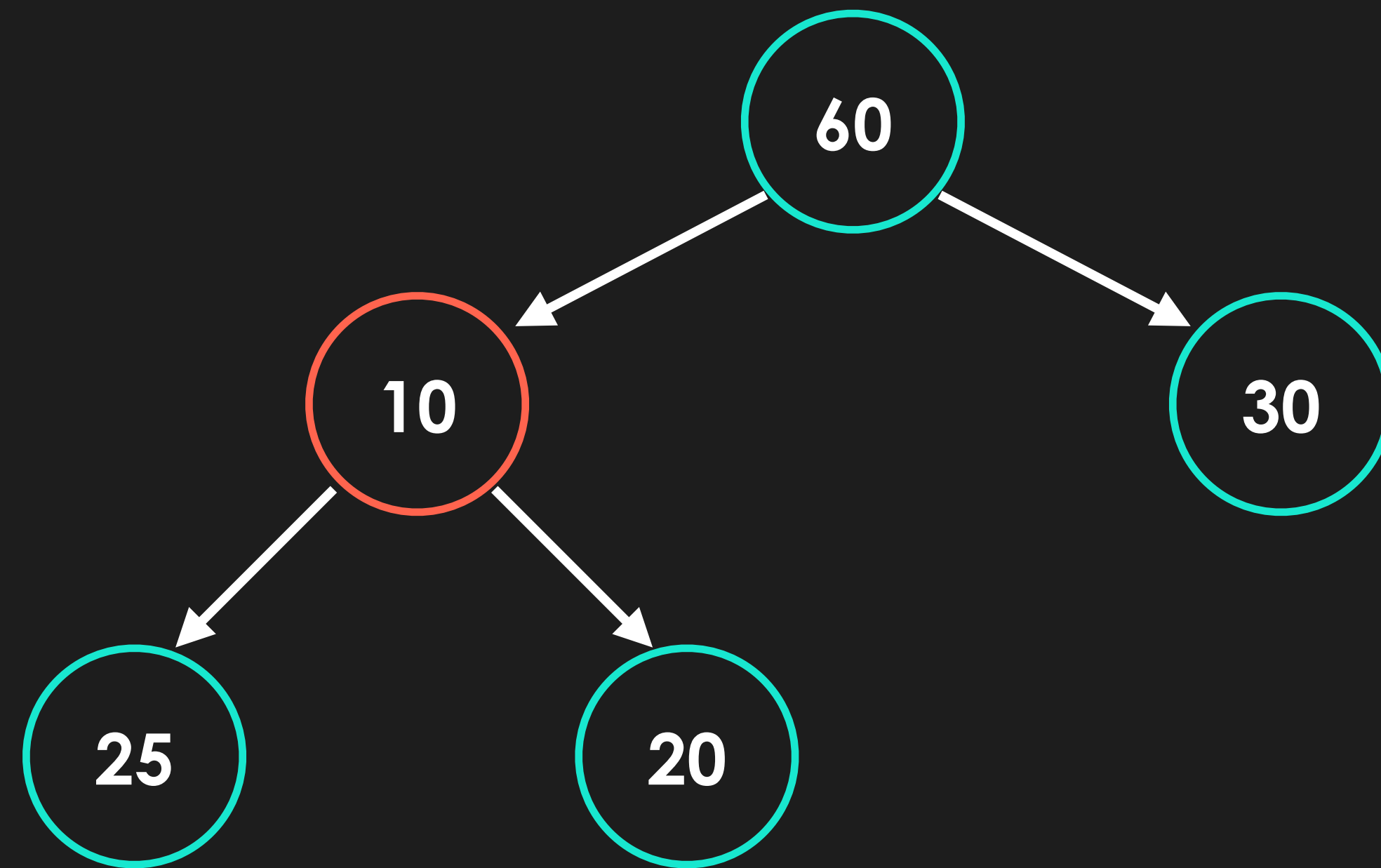
heap		60	40	30	25	20
	0	1	2	3	4	5

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5

## STEP 3: Assign new value to item

```
pq.insert("Microsoft", 10)
```



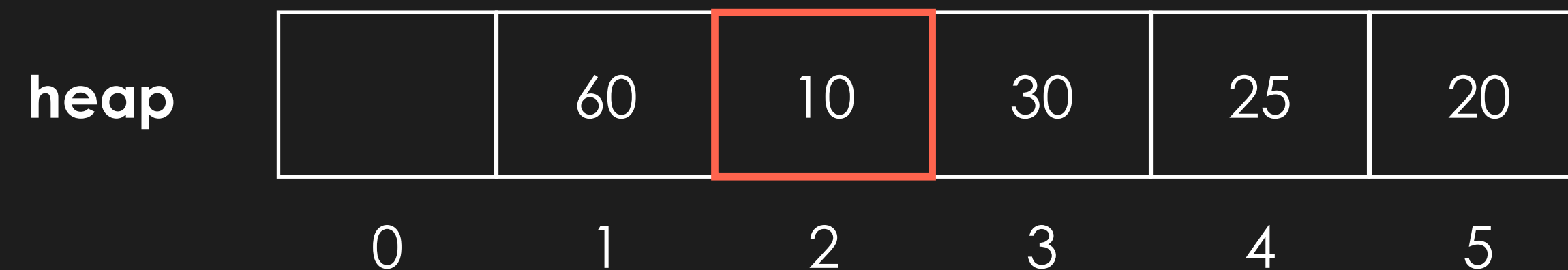
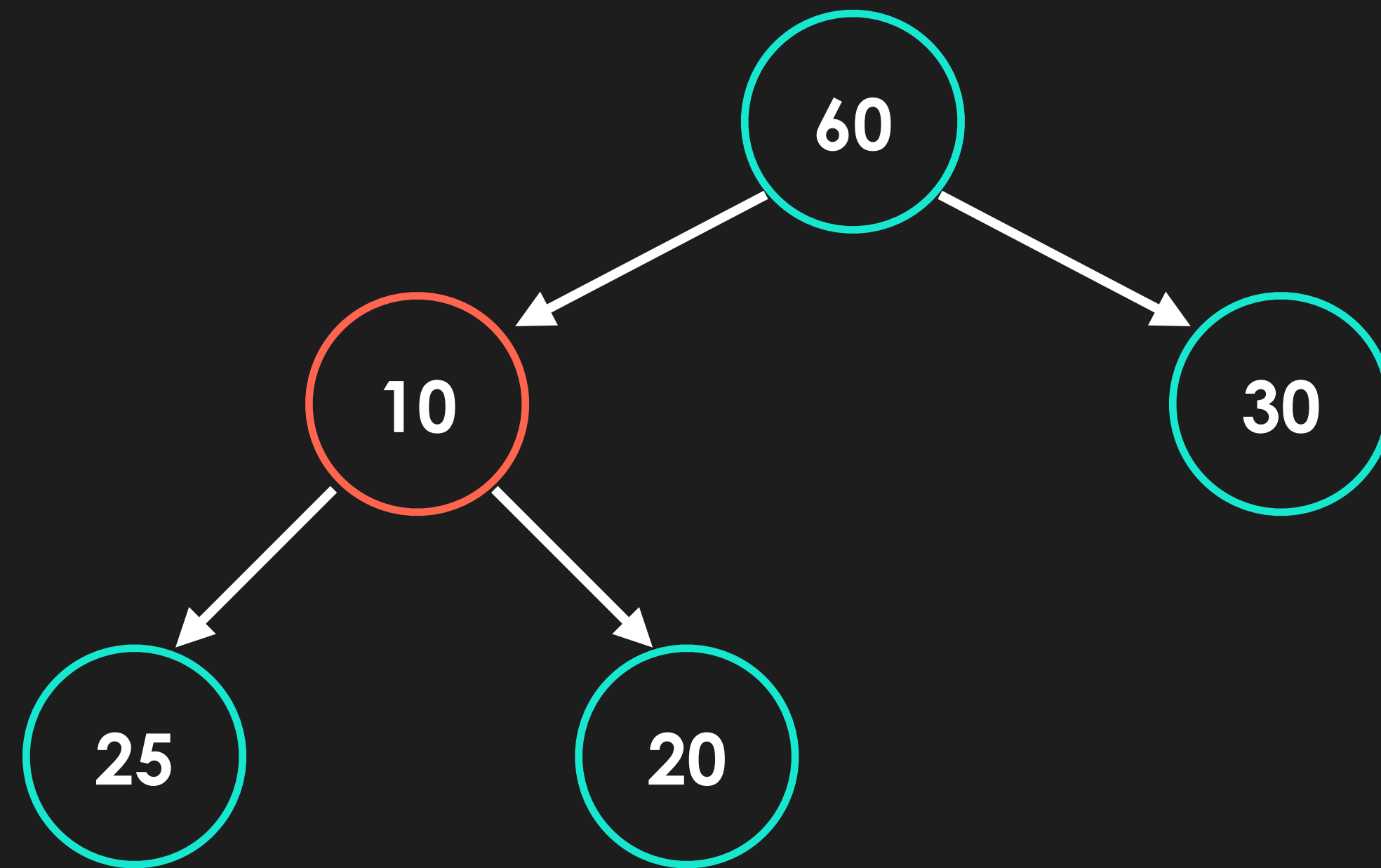
heap		60	10	30	25	20
	0	1	2	3	4	5

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5



**STEP 4: If parent value is lower priority, perform swim, else, perform sink**

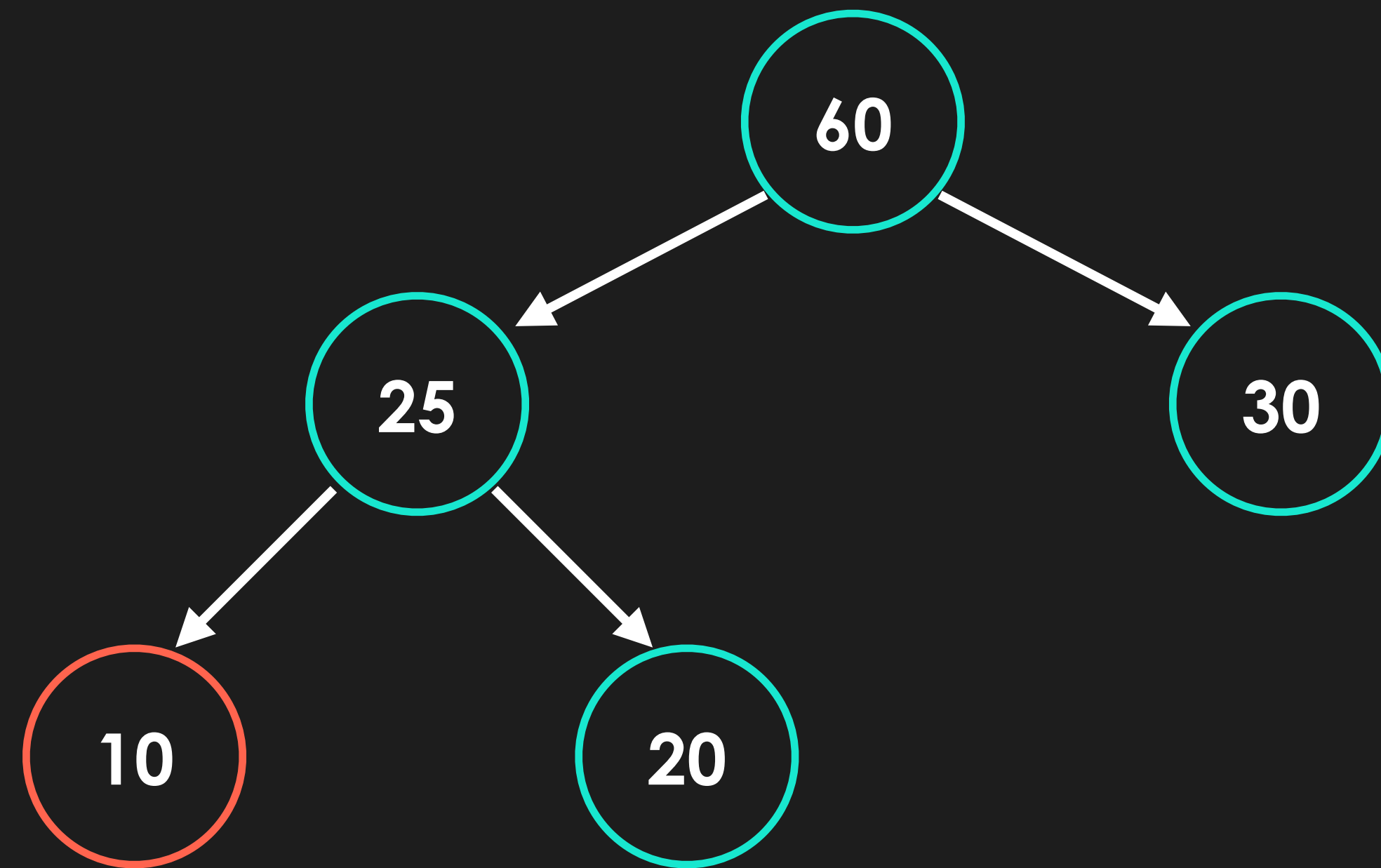


```
pq.insert("Microsoft", 10)
```

positions

key	value
"Apple"	1
"Microsoft"	2
"Google"	3
"Netflix"	4
"Amazon"	5

**STEP 4: If parent value is lower priority, perform swim, else, perform sink**



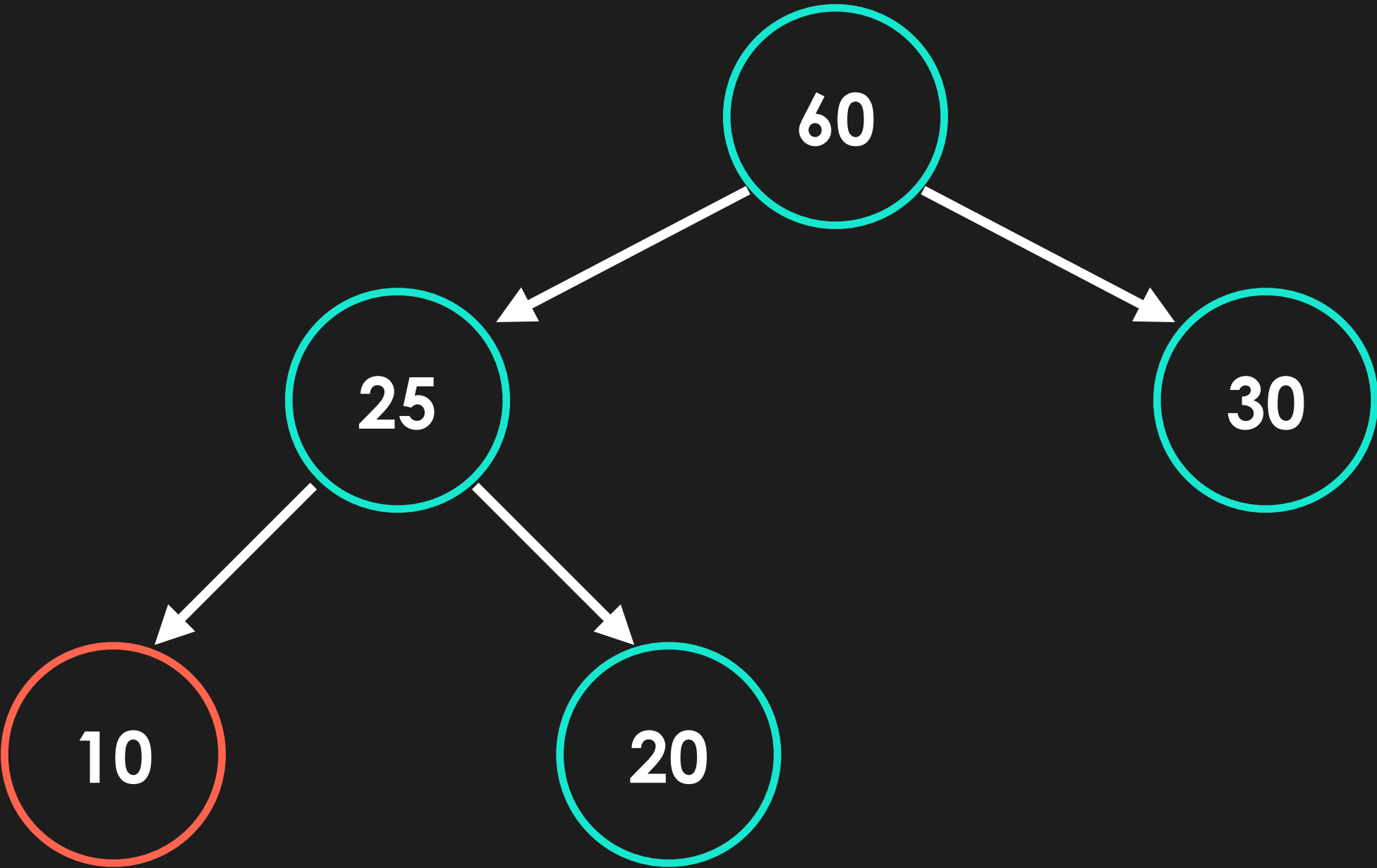
```
pq.insert("Microsoft", 10)
```

positions

key	value
"Apple"	1
"Amazon"	2
"Google"	3
"Microsoft"	4
"Amazon"	5

Note: When swapping, you must now also swap in positions dictionary!

```
pq.insert("Microsoft", 10)
```



heap

	60	25	30	10	20
0	1	2	3	4	5

positions

key	value
"Apple"	1
"Amazon"	2
"Google"	3
"Microsoft"	4
"Amazon"	5

# Implementation

# constructor

```
def __init__(self, maxsize):  
    self.maxsize = maxsize  
    self.size = 0  
    self.heap = [None] * (maxsize + 1)  
    self.positions = {}
```

# swap

```
def swap (array, positions, index1, index2):  
    key1 = array[index1].key  
    key2 = array[index2].key  
    positions[key1], positions[key2] = positions[key2], positions[key1]  
    array[index1], array[index2] = array[index2], array[index1]
```

# insert

```
def insert(self, newKey, newValue):
    if self.size >= self.maxsize:
        print('size limit reached')
        return

    # HANDLE EXISTING KEY, NEW VALUE
    if newKey in self.positions:

        currentIndex = self.positions[newKey]
        self.heap[currentIndex].value = newValue

        if self.greater(currentIndex, parent(currentIndex)):
            self.swim(currentIndex)
        else:
            self.sink(currentIndex)

    return

    self.size += 1
    self.heap[self.size] = HeapItem(newKey, newValue)
    self.positions[newKey] = self.size

    self.swim(self.size)
```

# When would we need changing values?



# When would we need changing values?

In Dijkstra's algorithm, if we have a heap that handles changing values, we can achieve a faster time complexity for the algorithm!

# Lab Session 1

- Implement `min_heap2.py`
- To test, run ``python utils/mh2_test.py``