

# CSC 212

## Data Structures and Abstractions

Fall 2020

Prof. Marco Alvarez

### Priority Queues and Heaps

# Quick Notes

- Assignment 4 is out - autograder will be up tomorrow
- List of Projects will be out this weekend
  - teams of 2-3 students
  - first-come first-served (there will be a limit on the number of teams that can select a topic)

Collections. Insert and delete items. Which item to delete?

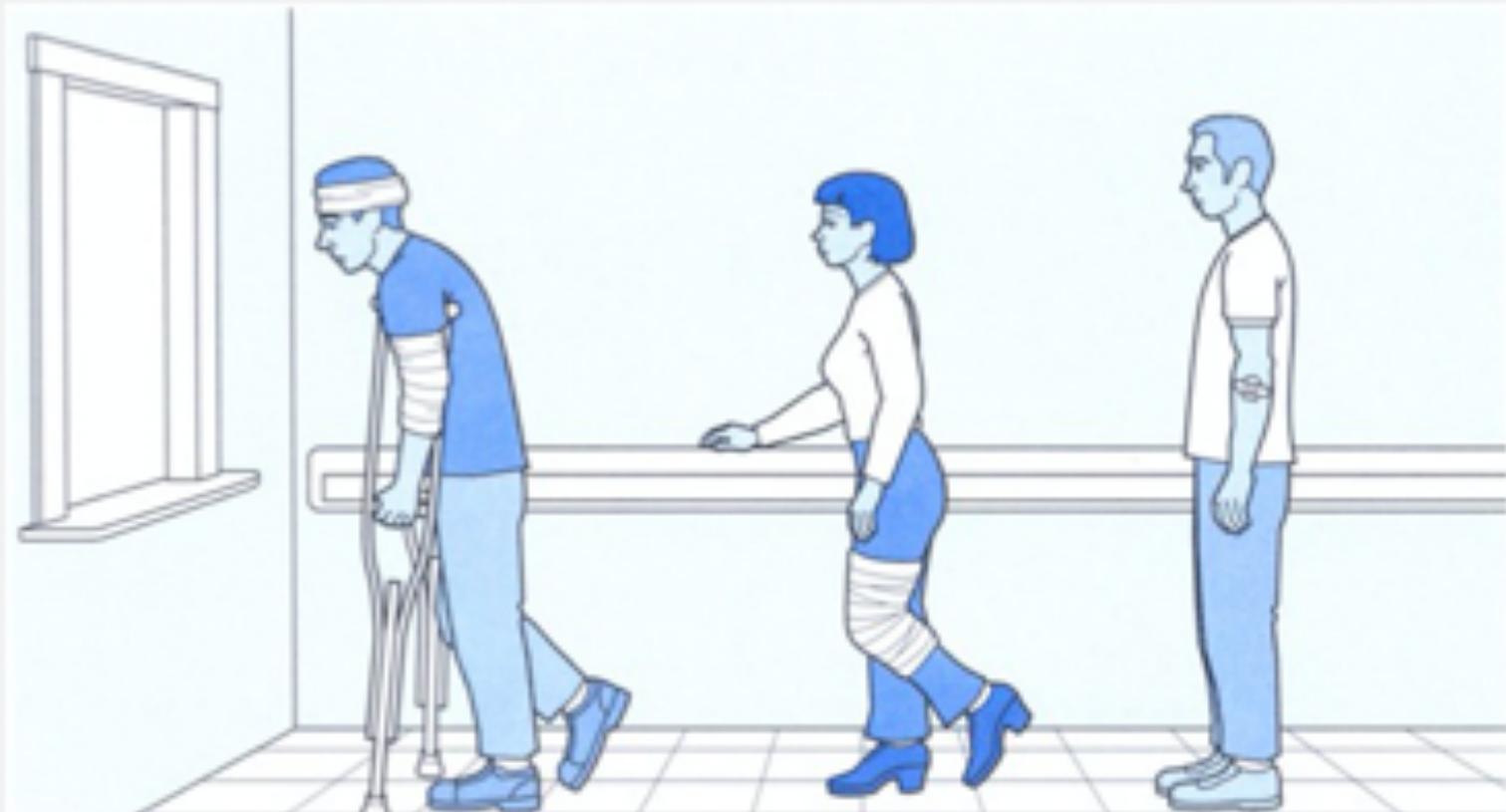
Stack. Remove the item most recently added.

Queue. Remove the item least recently added.

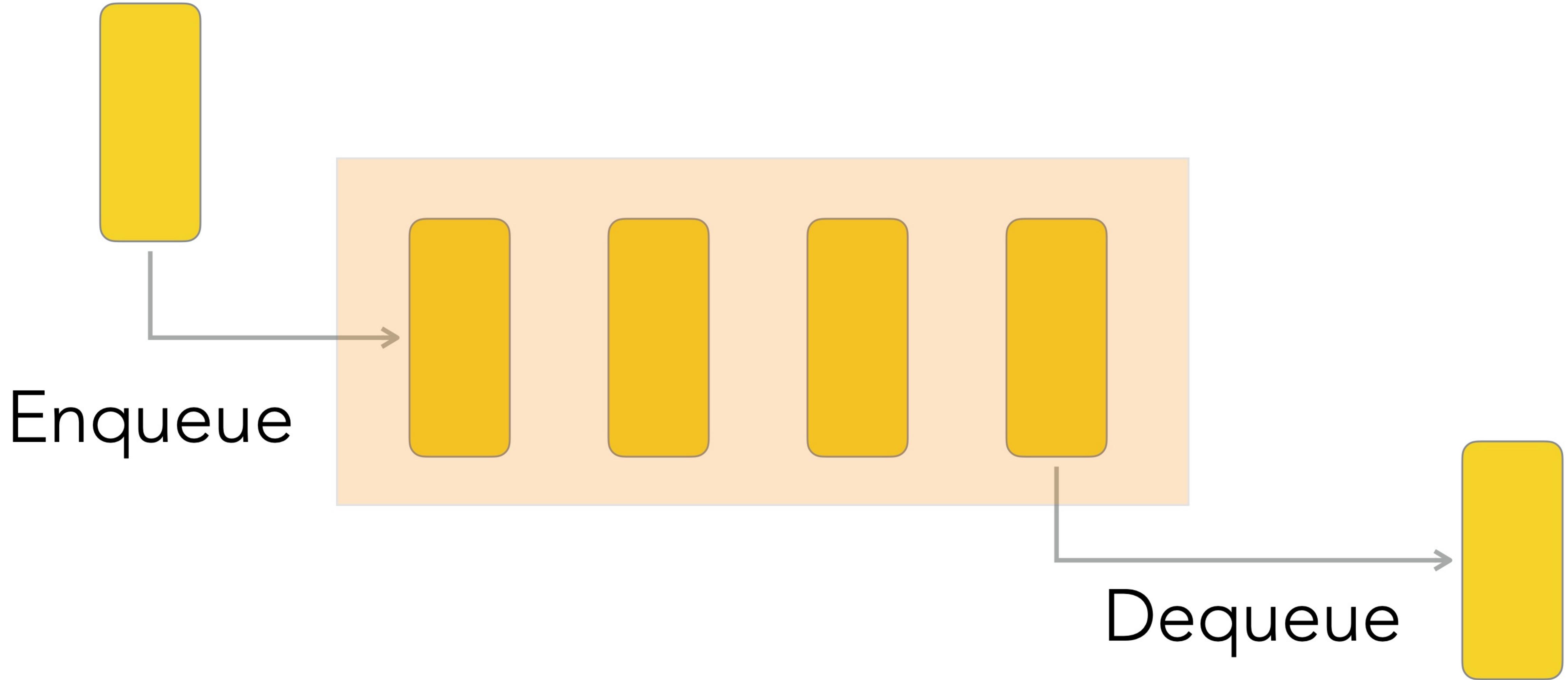
Randomized queue. Remove a random item.

Priority queue. Remove the largest (or smallest) item.

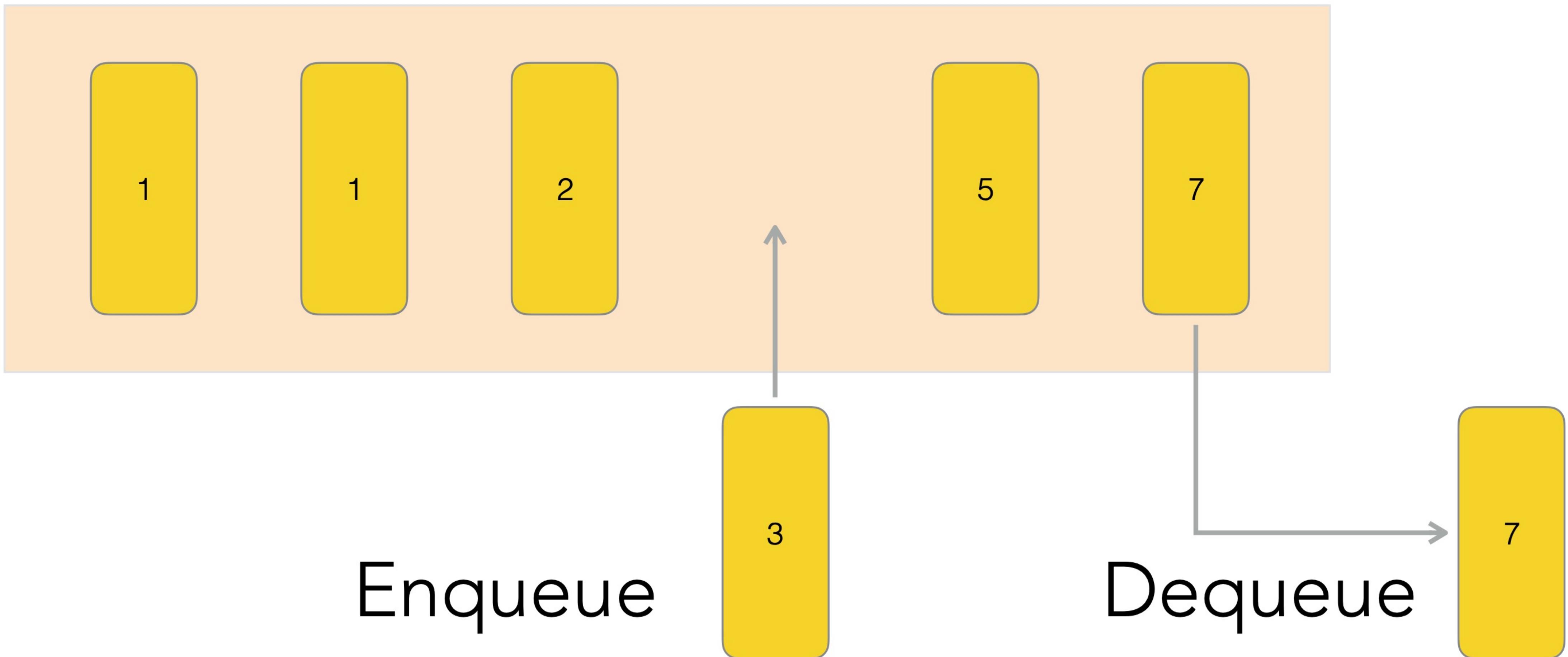
Generalizes: stack, queue, randomized queue.



# Queues



# Priority Queues



# Applications

Data Compression (huffman trees)

Process Scheduling (CPUs)

Graph Algorithms

Stream Data Algorithms

HPC Task Scheduling

Network Routing

Artificial Intelligence (search)

...

# Priority Queues

Collections of <Key,Value> pairs

**keys** are objects on which an **order** is defined

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Collections of <Key,Value> pairs

**keys** are objects on which an **order** is defined

Every pair of keys must be comparable according to a **total order**:

Reflexive Property:  $k \leq k$

Antisymmetric Property: if  $k_1 \leq k_2$  and  $k_2 \leq k_1$ , then  $k_1 = k_2$

Transitive Property: if  $k_1 \leq k_2$  and  $k_2 \leq k_3$ , then  $k_1 \leq k_3$

# Priority Queues

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basic operations: **enqueue, dequeue**

always remove the item least recently added

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## Priority Queues (MaxPQ)

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basic operations: **insert, removeMax**

always remove the item with **highest (max) priority**

**Can also be implemented as a MinPQ**

# Example (MinPQ)

Method	Return Value	Priority Queue Contents
insert(5,A)		{ (5,A) }
insert(9,C)		{ (5,A), (9,C) }
insert(3,B)		{ (3,B), (5,A), (9,C) }
min()	(3,B)	{ (3,B), (5,A), (9,C) }
removeMin()	(3,B)	{ (5,A), (9,C) }
insert(7,D)		{ (5,A), (7,D), (9,C) }
removeMin()	(5,A)	{ (7,D), (9,C) }
removeMin()	(7,D)	{ (9,C) }
removeMin()	(9,C)	{ }
removeMin()	null	{ }
isEmpty()	true	{ }

# Performance?

	Sorted Array/List	Unsorted Array/List
insert		
removeMax		
max		

# Performance

	Sorted Array/List	Unsorted Array/List
insert	$O(n)$	$O(1)$
removeMax	$O(1)$	$O(n)$
max	$O(1)$	$O(n)$

# std::priority\_queue

Defined in header `<queue>`

```
template<
    class T,
    class Container = std::vector<T>,
    class Compare = std::less<typename Container::value_type>
> class priority_queue;
```

A priority queue is a container adaptor that provides constant time lookup of the largest (by default) element, at the expense of logarithmic insertion and extraction.

A user-provided Compare can be supplied to change the ordering, e.g. using `std::greater<T>` would cause the smallest element to appear as the [top\(\)](#).

Working with a `priority_queue` is similar to managing a [heap](#) in some random access container, with the benefit of not being able to accidentally invalidate the heap.

## Member functions

(constructor)	constructs the <code>priority_queue</code> (public member function)
(destructor)	destructs the <code>priority_queue</code> (public member function)
<code>operator=</code>	assigns values to the container adaptor (public member function)

## Element access

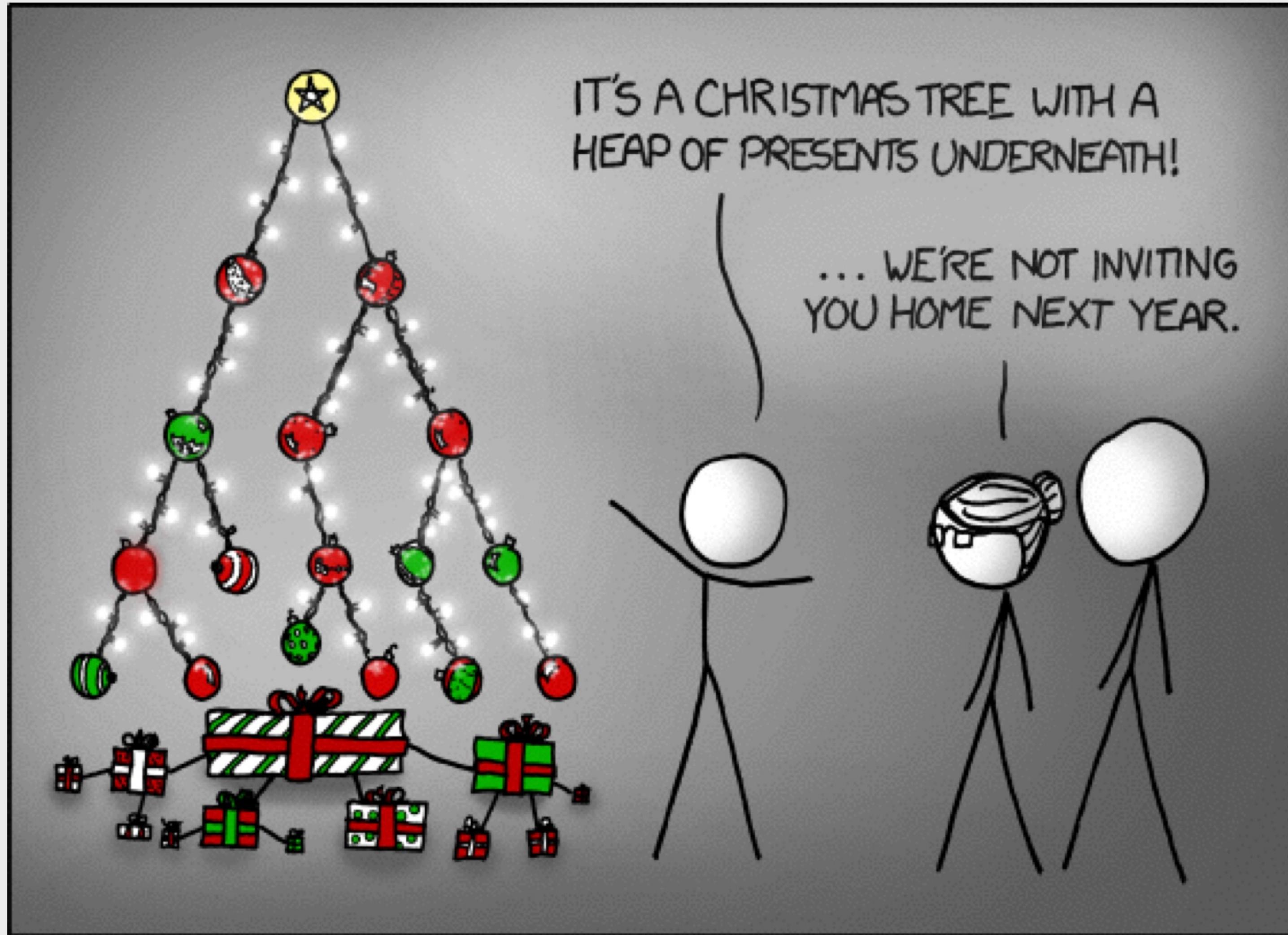
<code>top</code>	accesses the top element (public member function)
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## Capacity

<code>empty</code>	checks whether the underlying container is empty (public member function)
<code>size</code>	returns the number of elements (public member function)

## Modifiers

<code>push</code>	inserts element and sorts the underlying container (public member function)
<code>emplace</code> (C++11)	constructs element in-place and sorts the underlying container (public member function)
<code>pop</code>	removes the top element (public member function)
<code>swap</code>	swaps the contents (public member function)



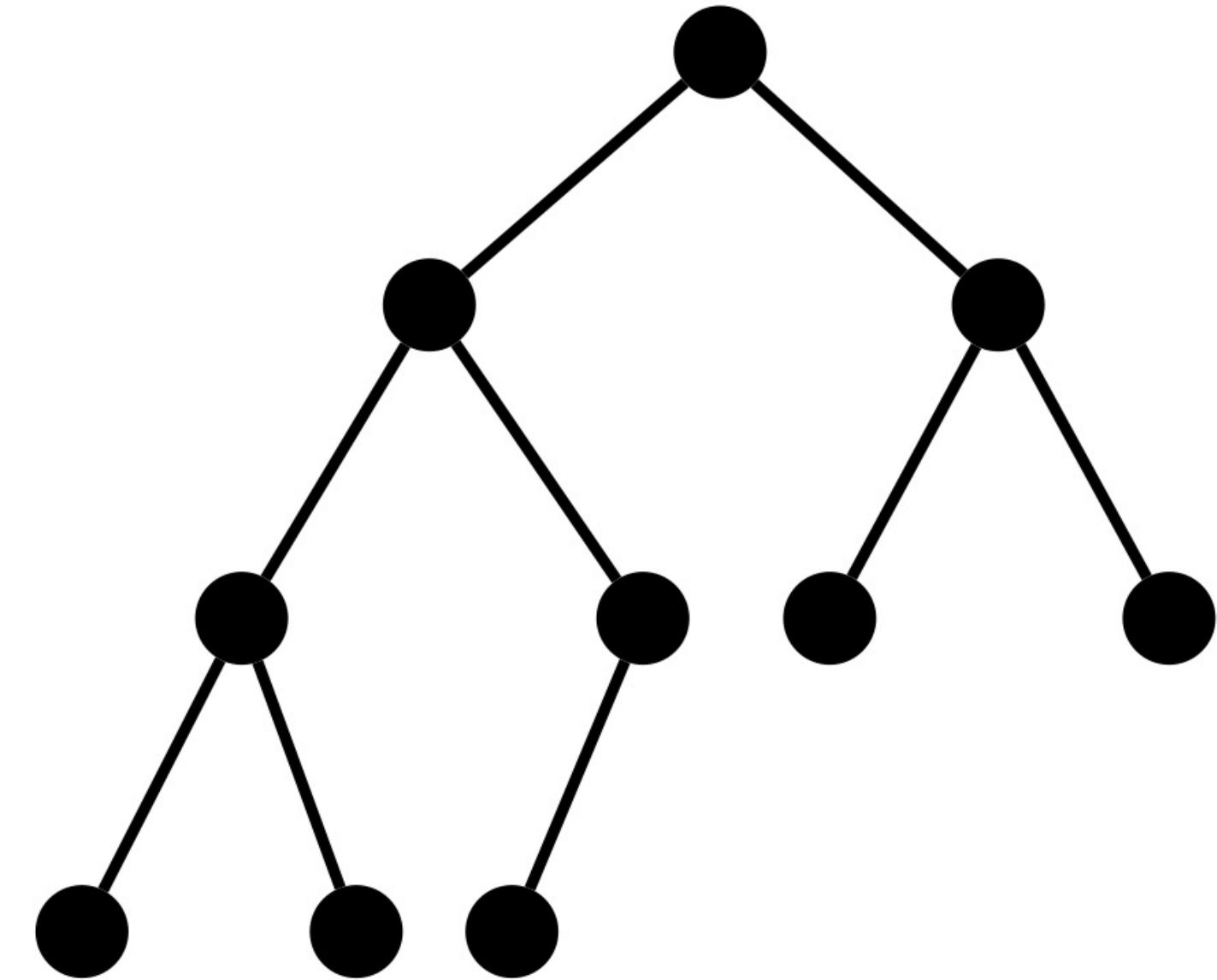
# Heaps

From <https://xkcd.com/835/>

# (max) Heap

## Structure Property

a heap is a **complete binary tree**



# (max) Heap

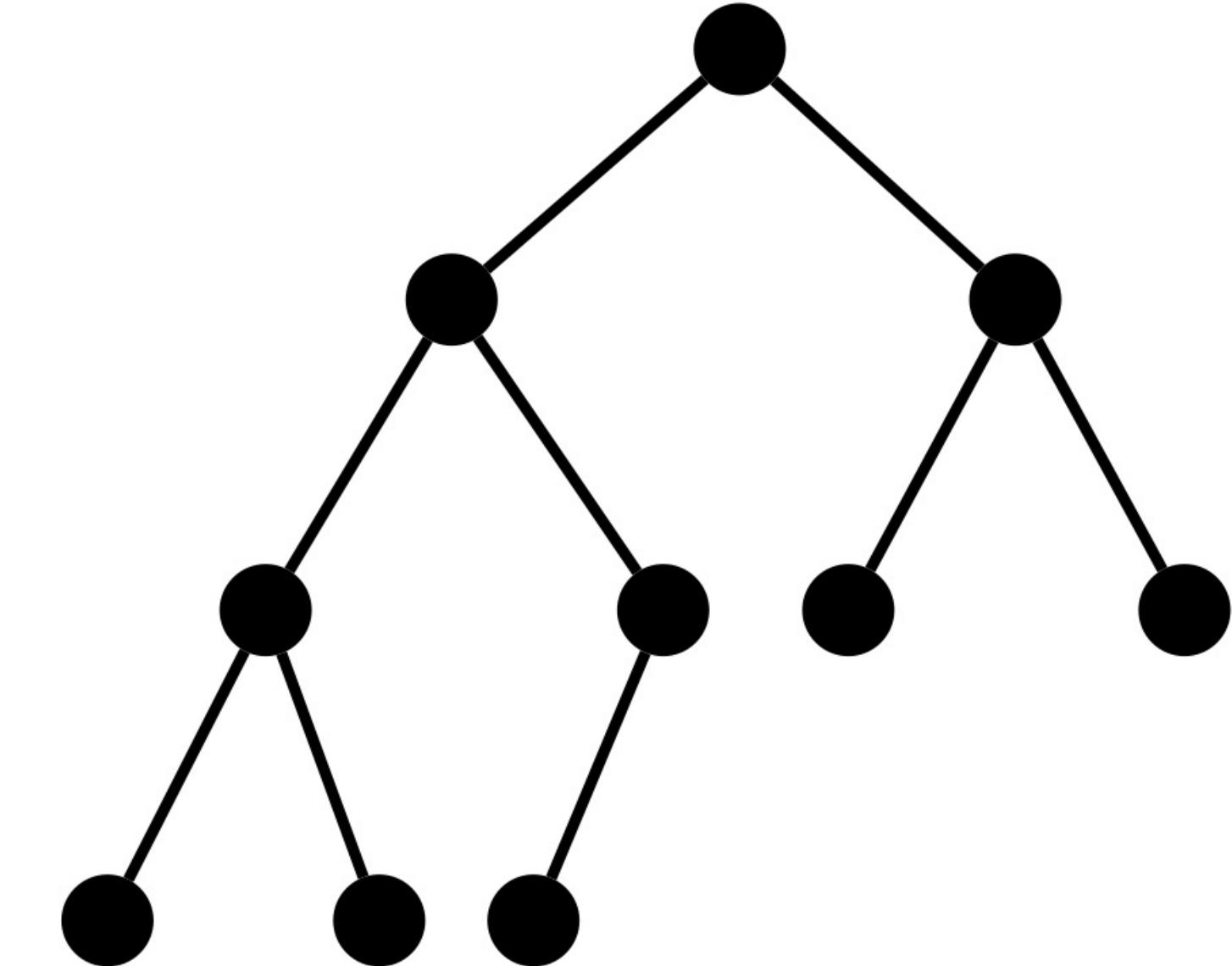
## Structure Property

a heap is a **complete binary tree**

## Heap-Order Property

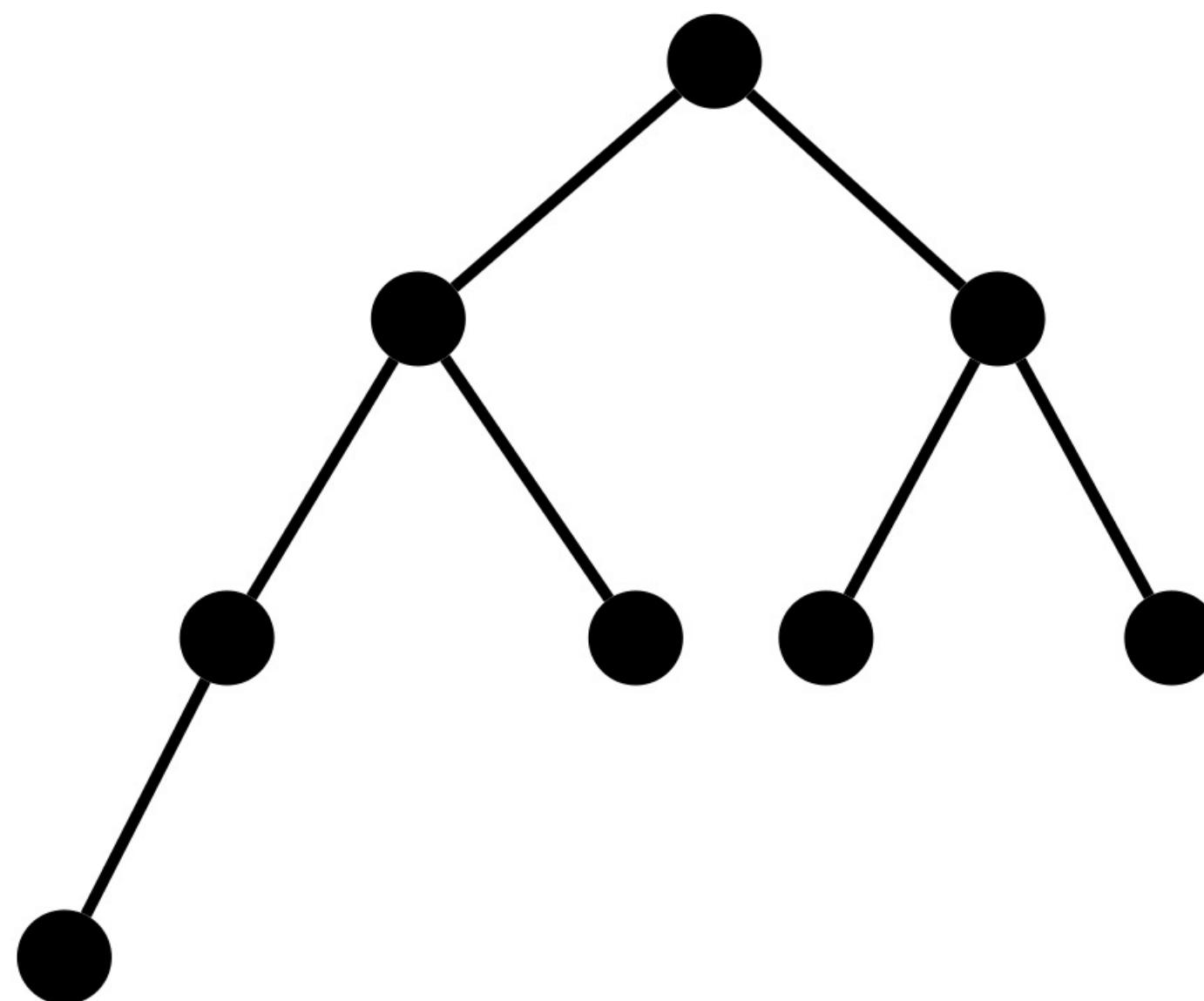
for every node  $x$ , **key(parent( $x$ ))  $\geq$  key( $x$ )**

except the root, which has no parent



# Height of a heap?

What is the minimum number of nodes in a complete binary tree of height  $h$ ?



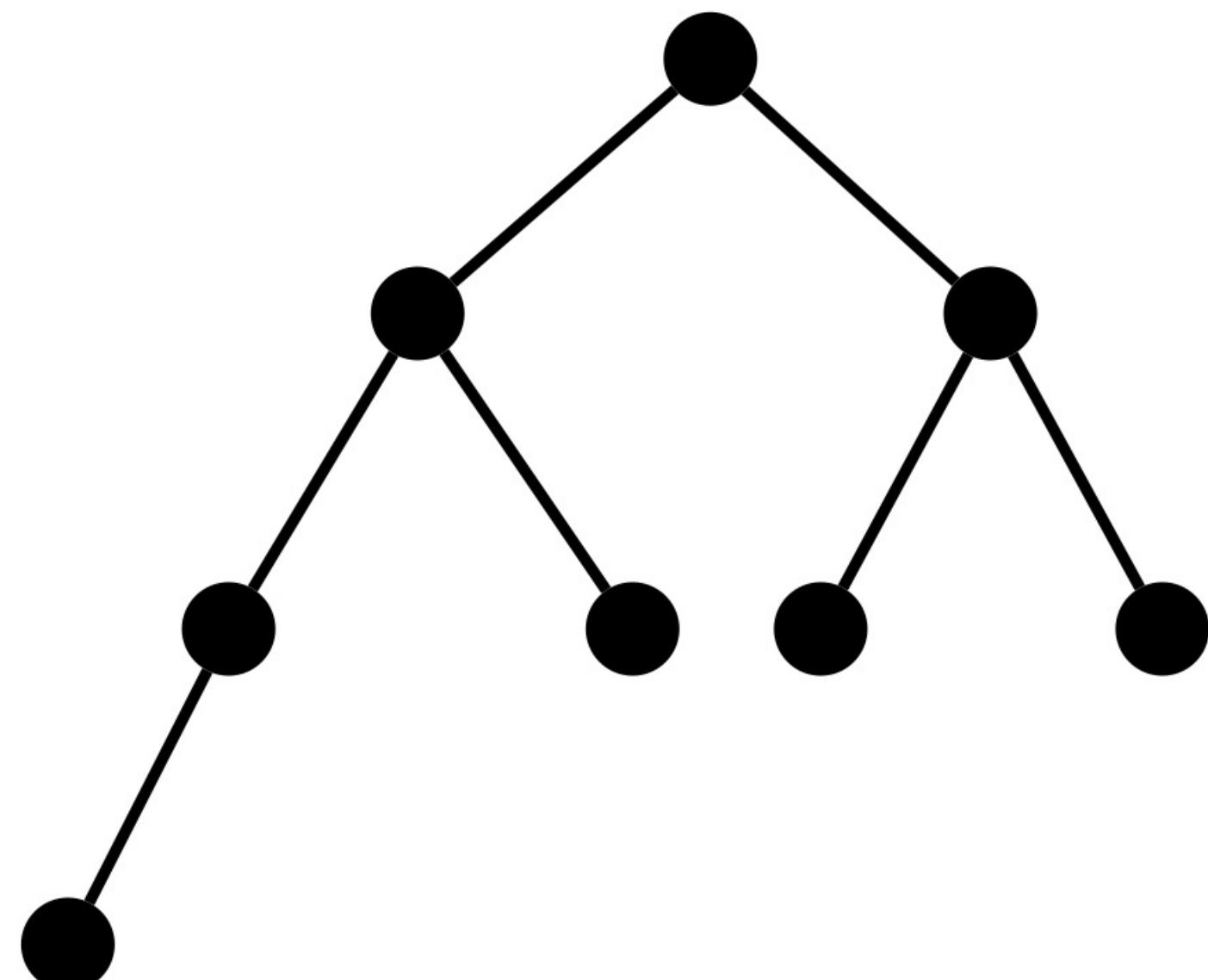
# Height of a heap?

What is the minimum number of nodes in a complete binary tree of height  $h$ ?

$$n \geq 2^h$$

$$\log n \geq \log 2^h$$

$$\log n \geq h$$

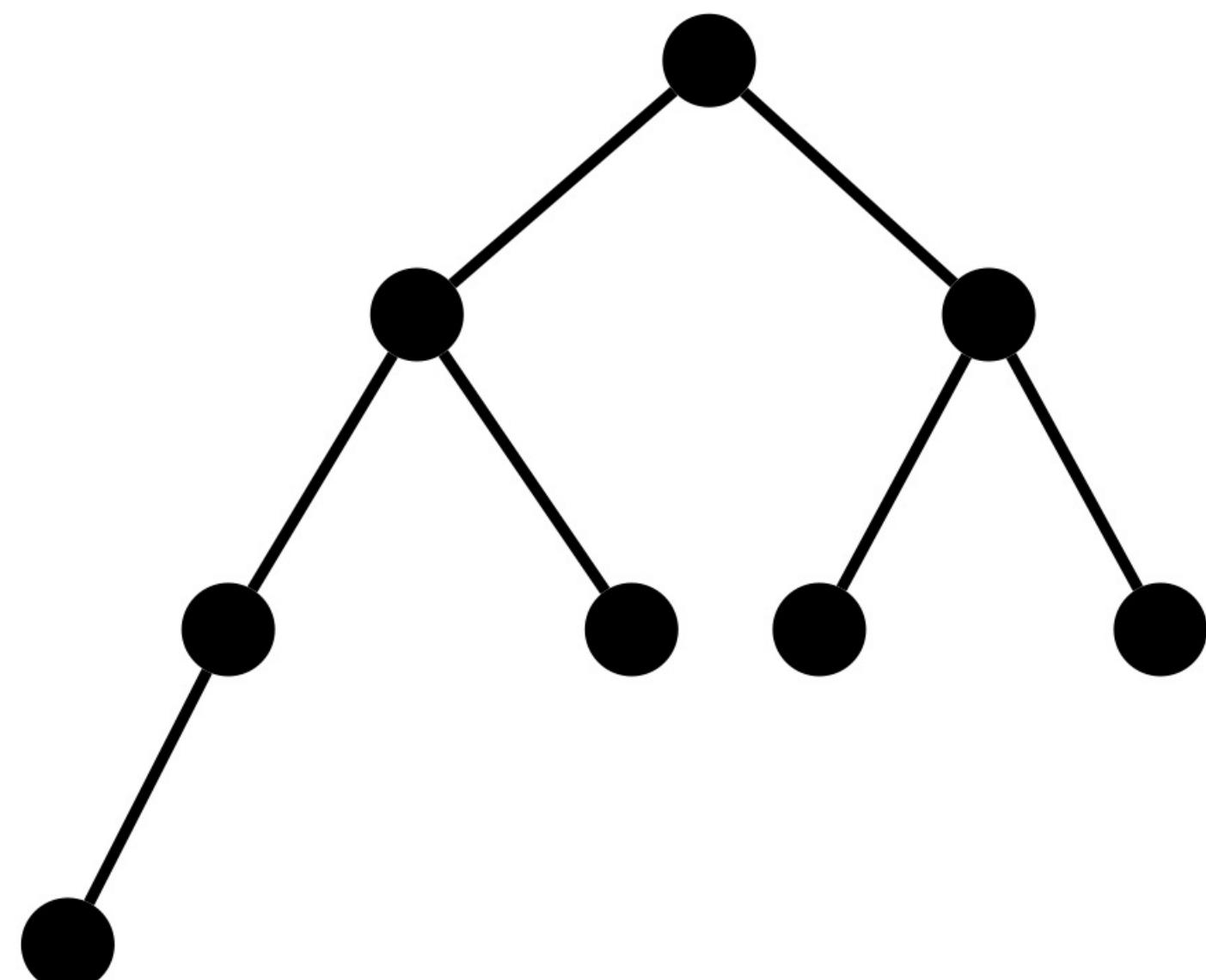


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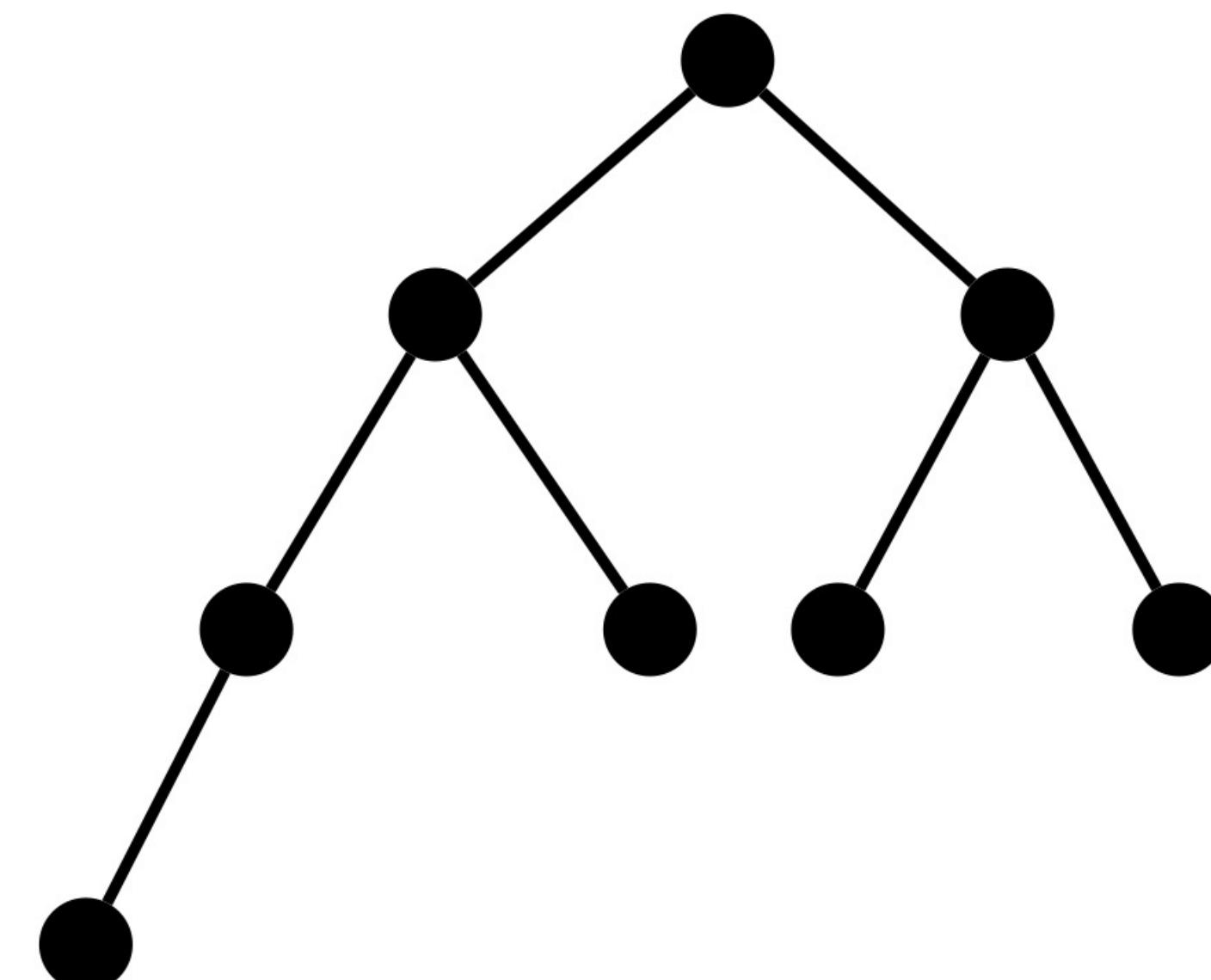
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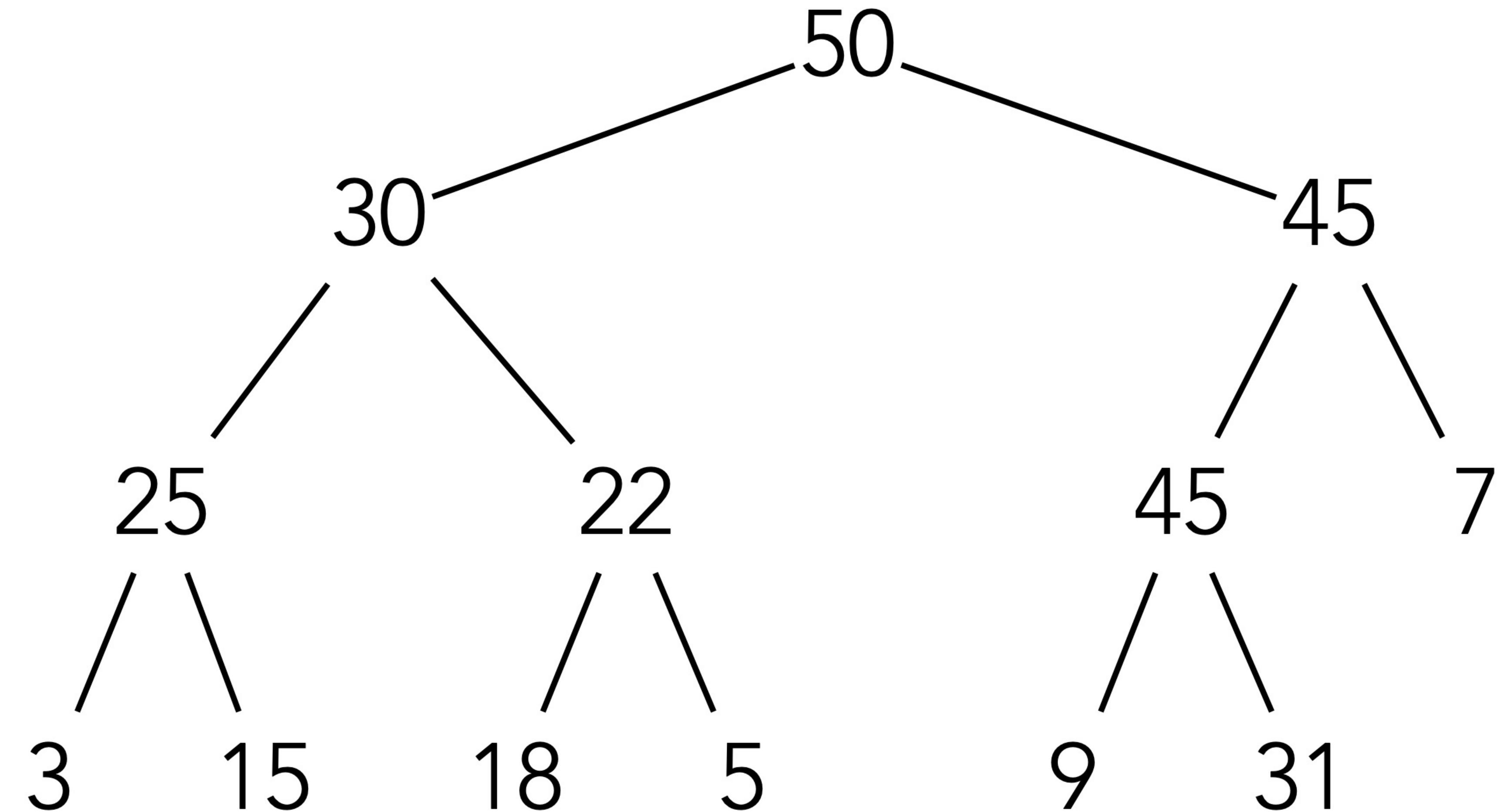
# Example

Structure

Property?

Heap-order

Property?



# Example

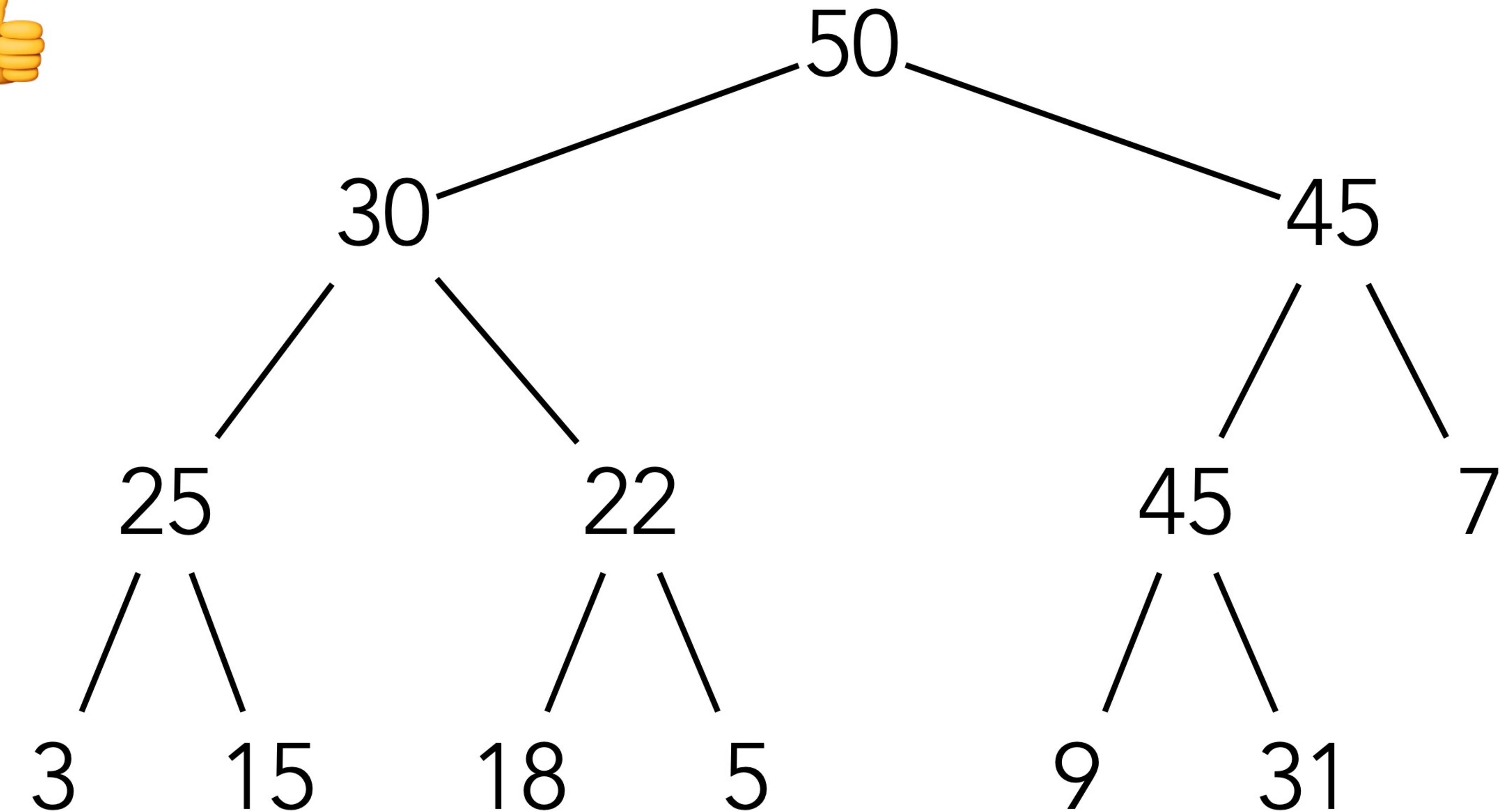
Structure



Property?

Heap-order

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# Example

Structure

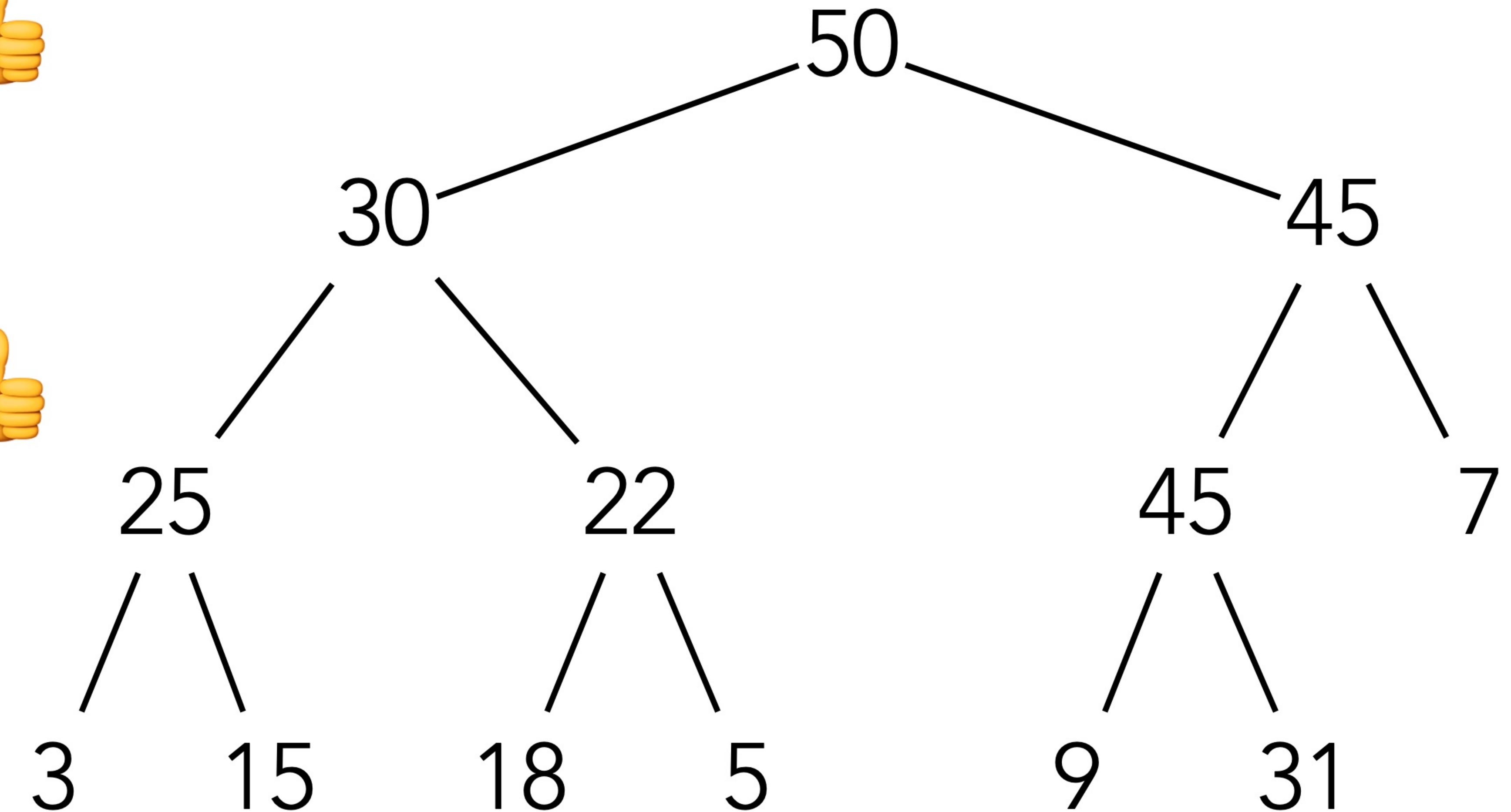


Property?

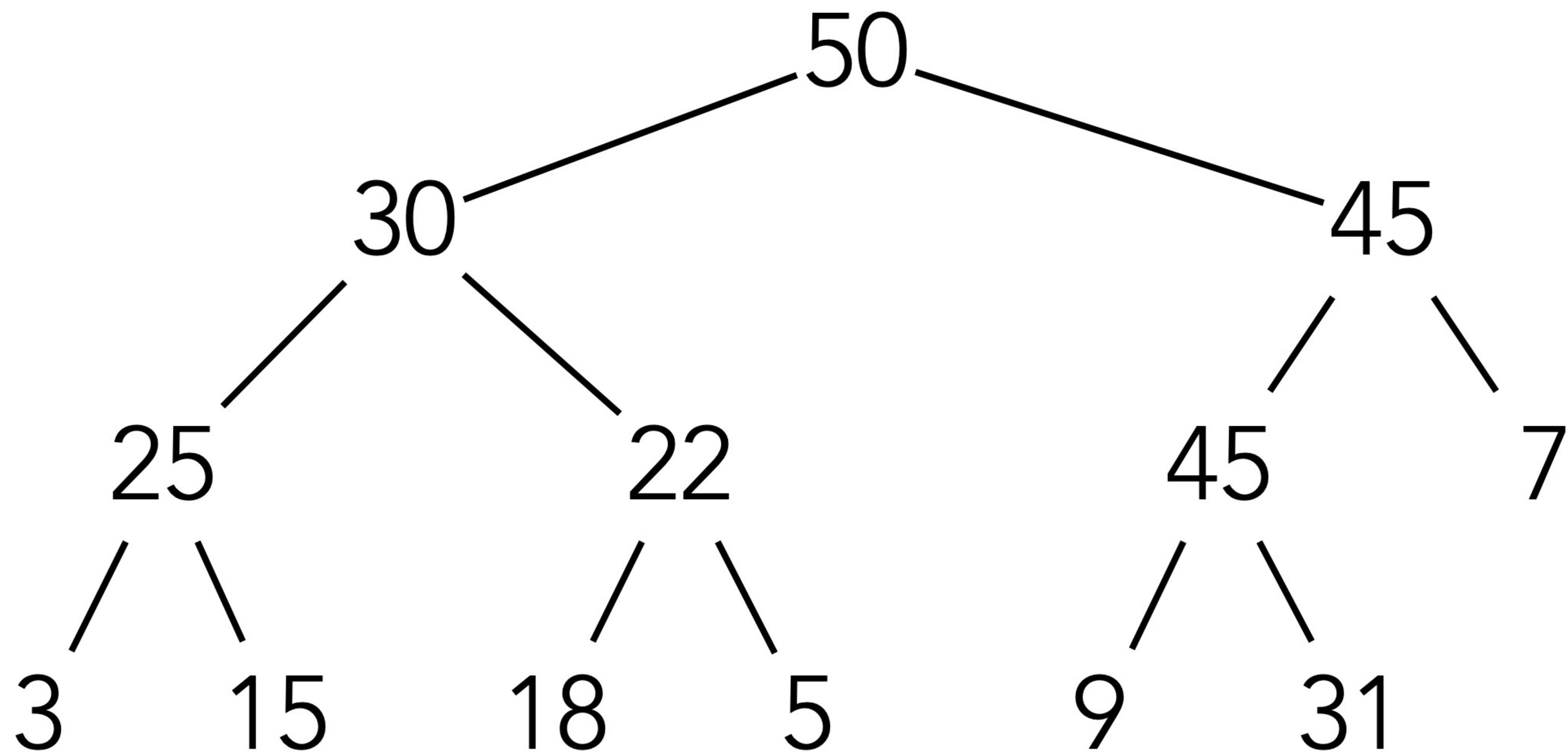
Heap-order



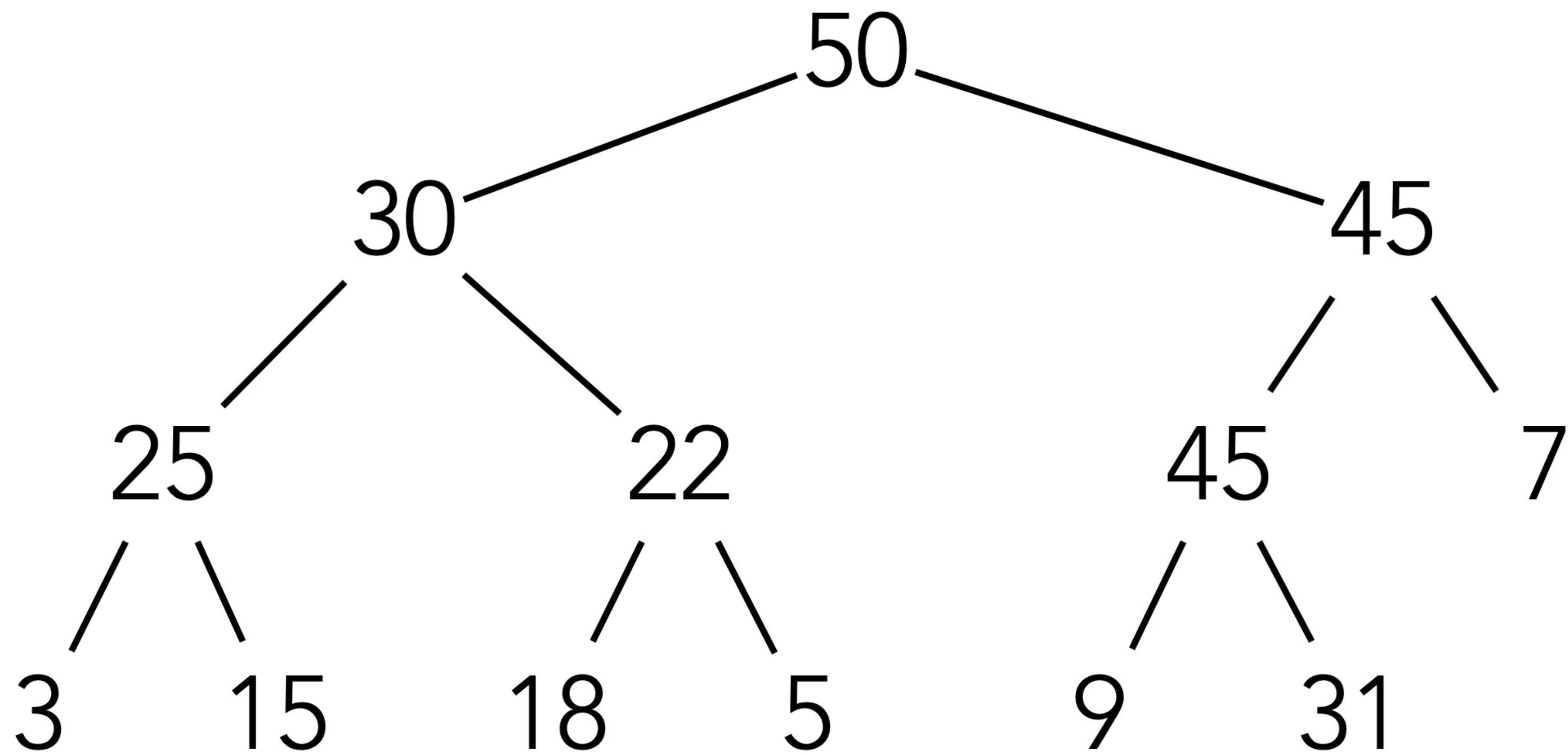
Property?



# Implementation

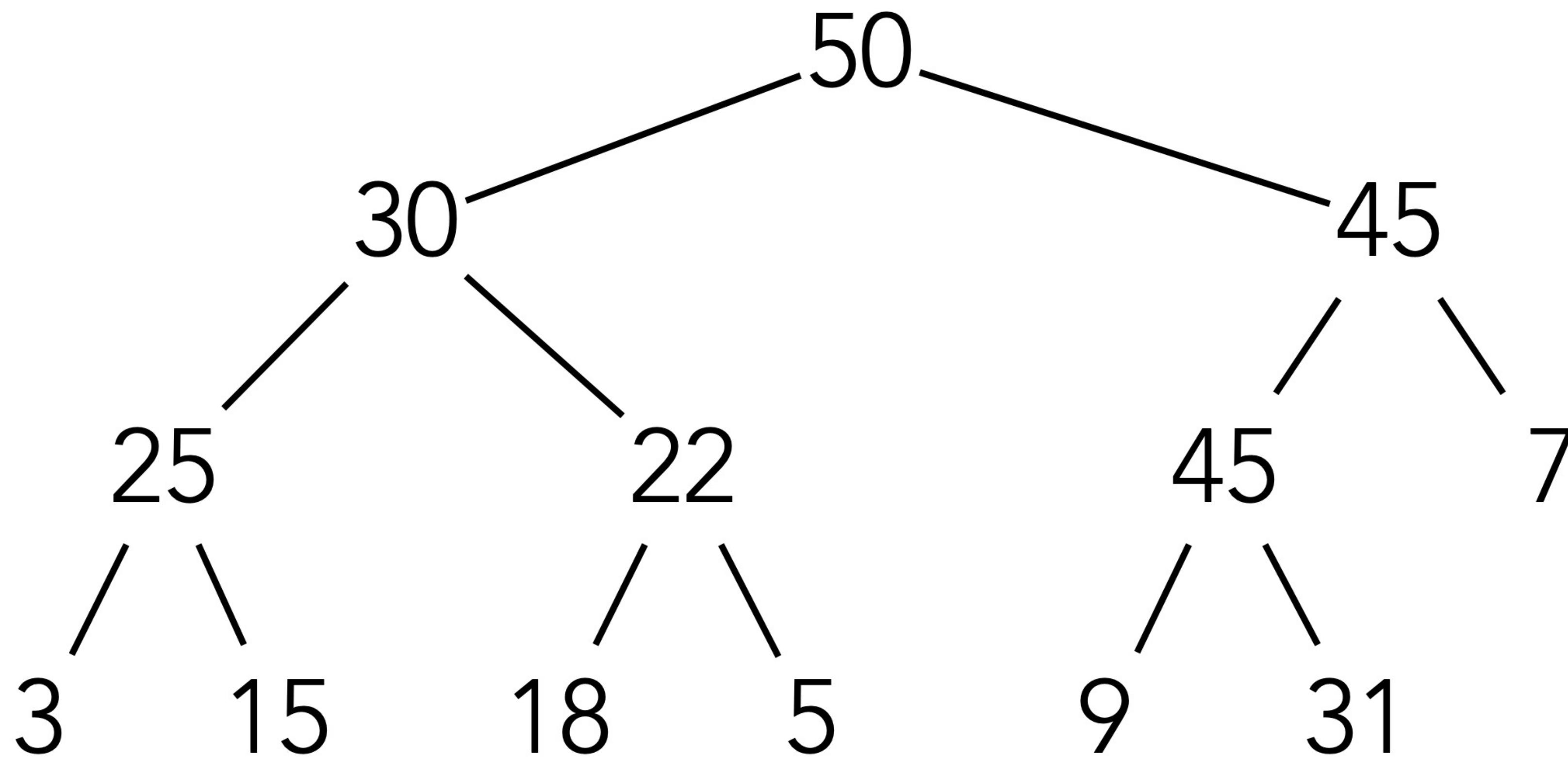


# Implementation



Complete tree ...

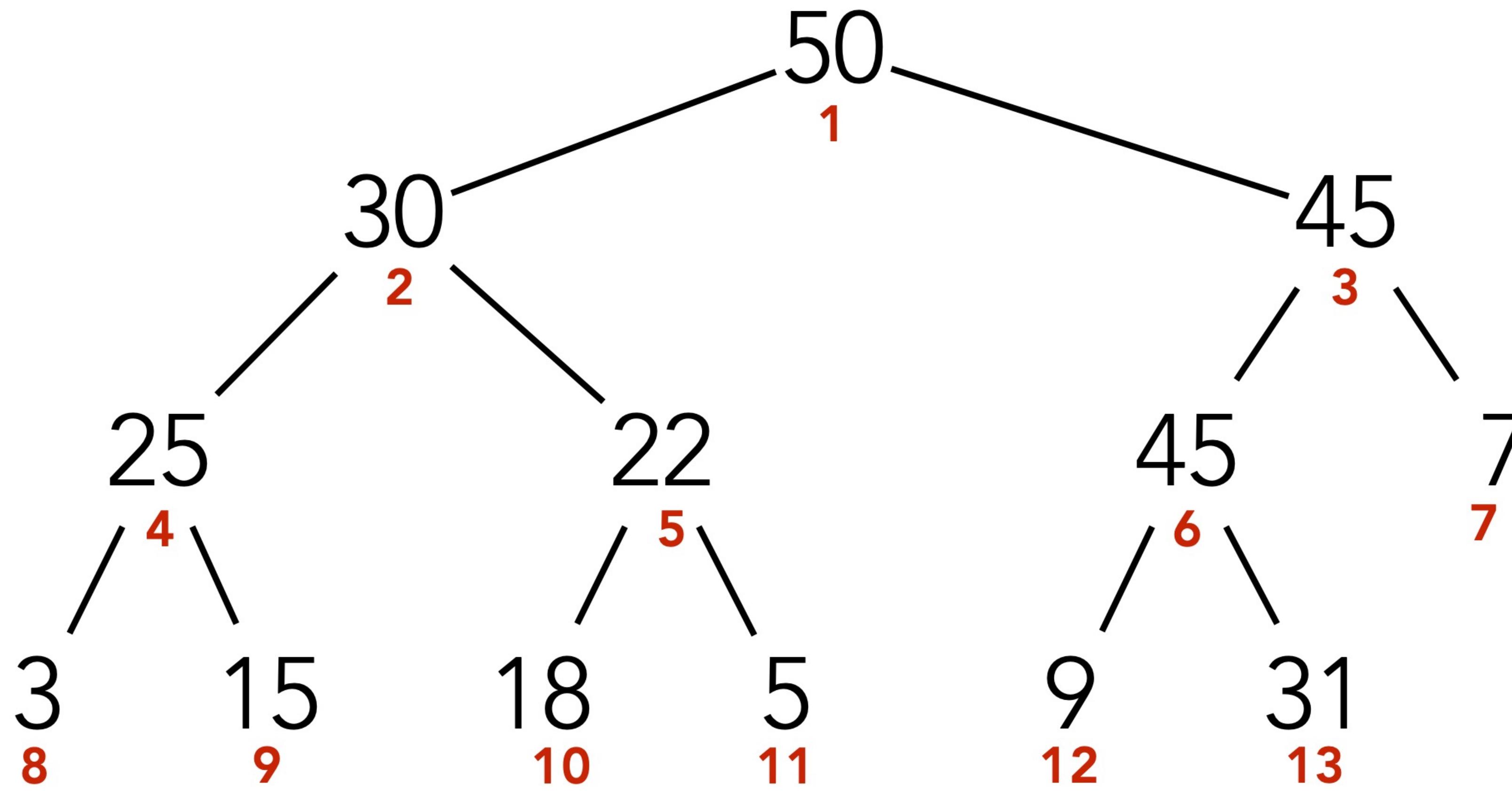
# Implementation



Complete tree ...

50	30	45	25	22	45	7	3	15	18	5	9	31
1	2	3	4	5	6	7	8	9	10	11	12	13

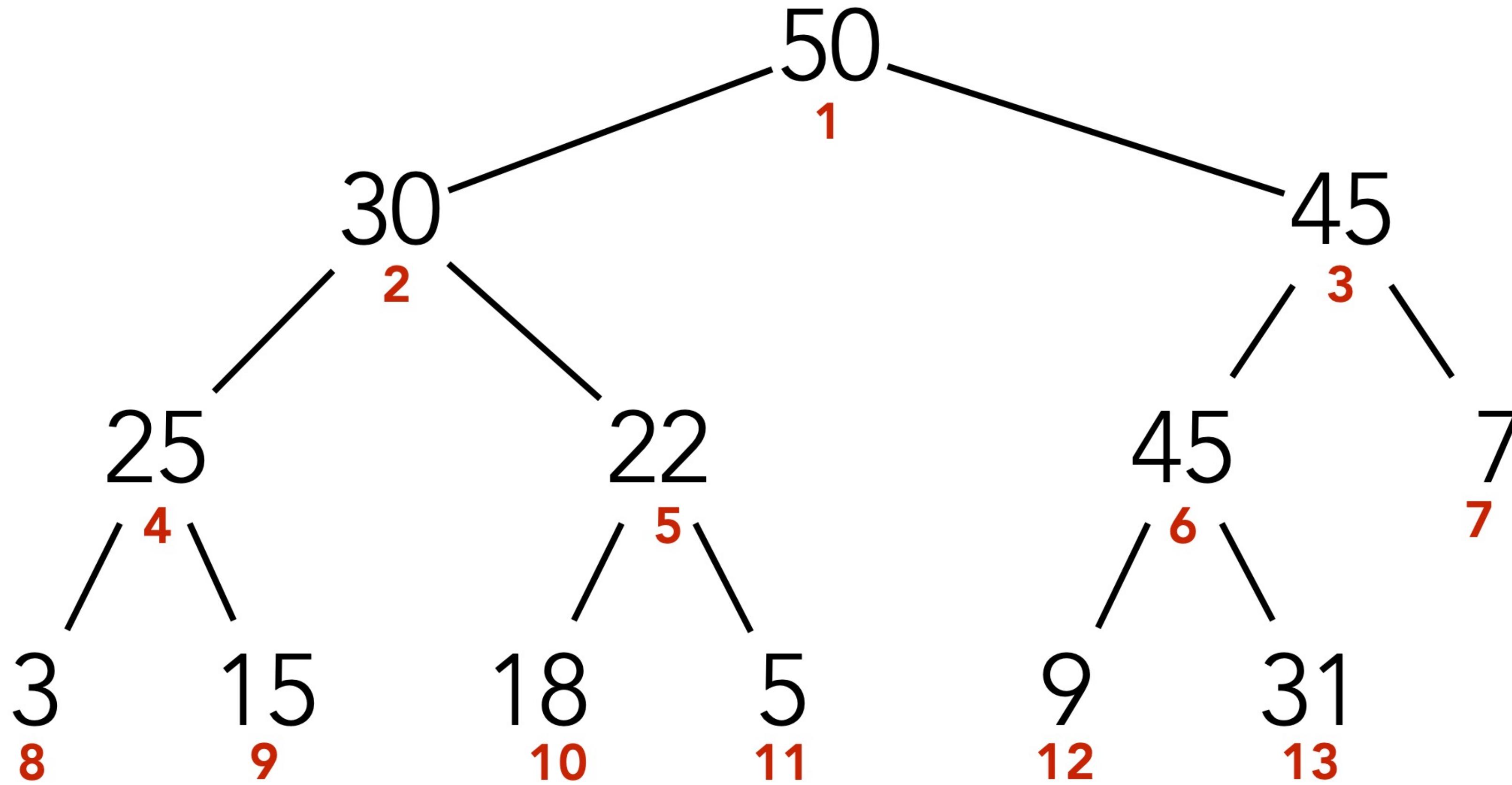
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Complete tree ...

50	30	45	25	22	45	7	3	15	18	5	9	31
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# Implementation



parent(i)

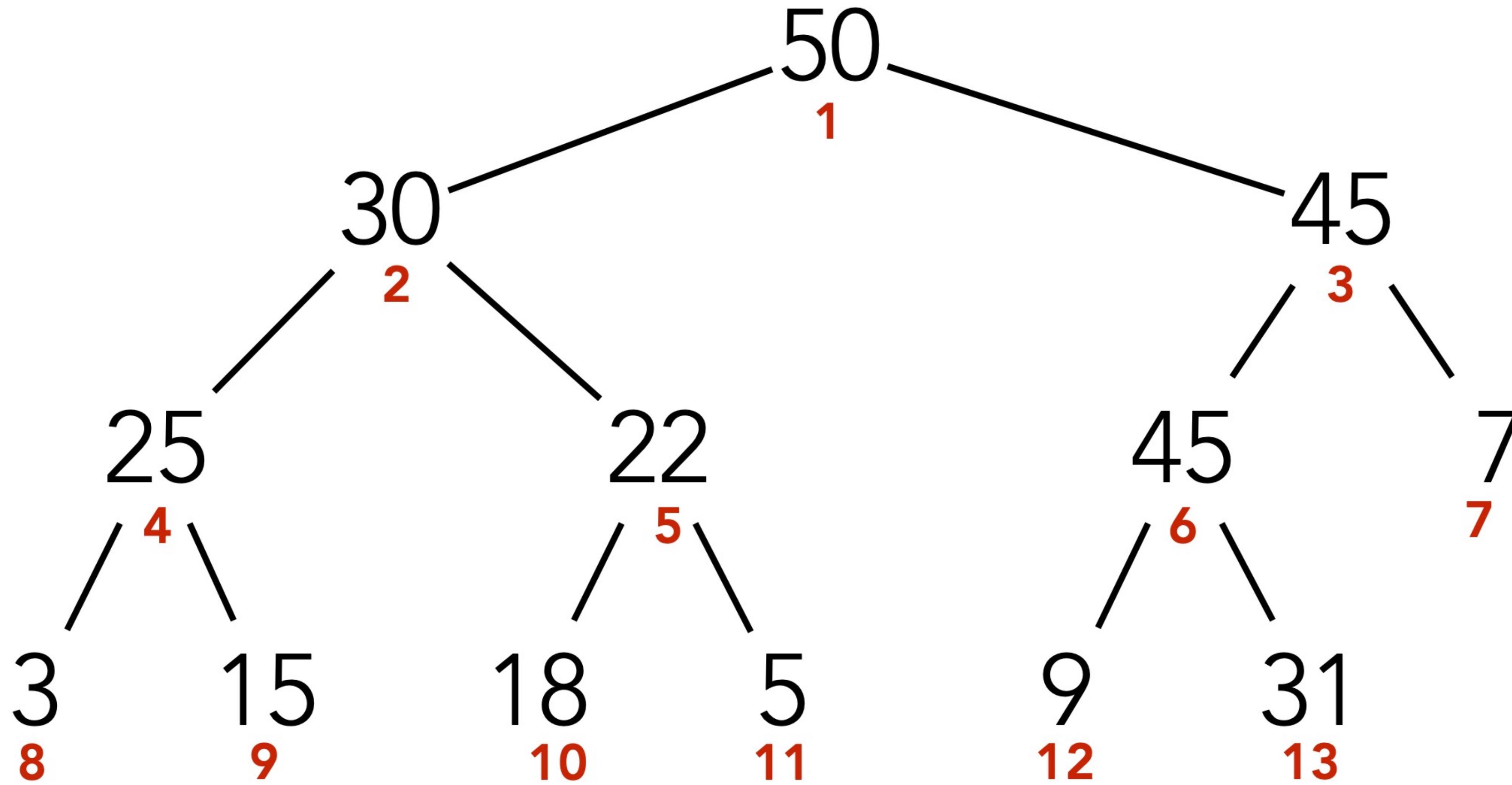
left\_child(i)

right\_child(i)

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1	2	3	4	5	6	7	8	9	10	11	12	13

# Implementation



parent(i)

floor(i/2)

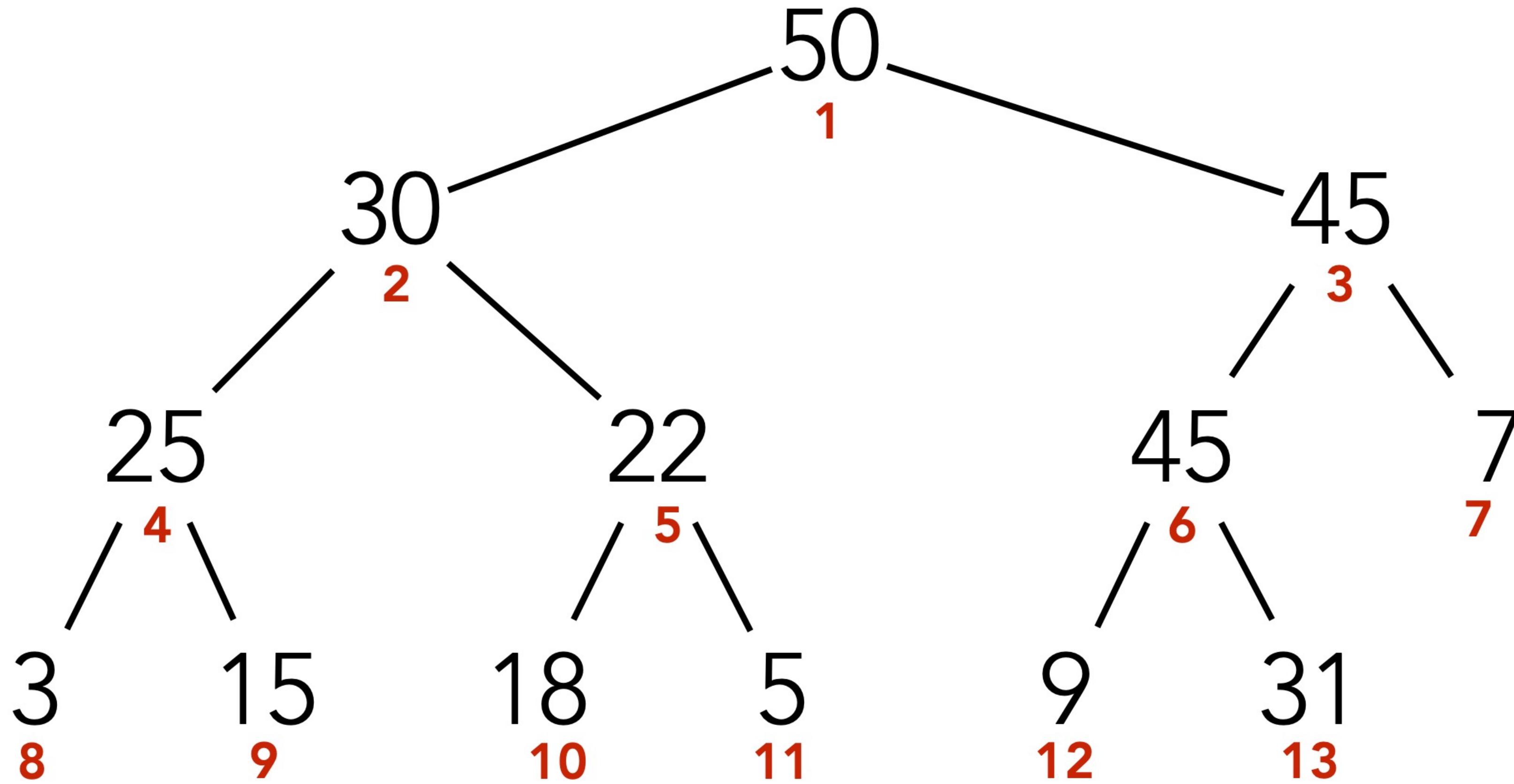
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# Implementation



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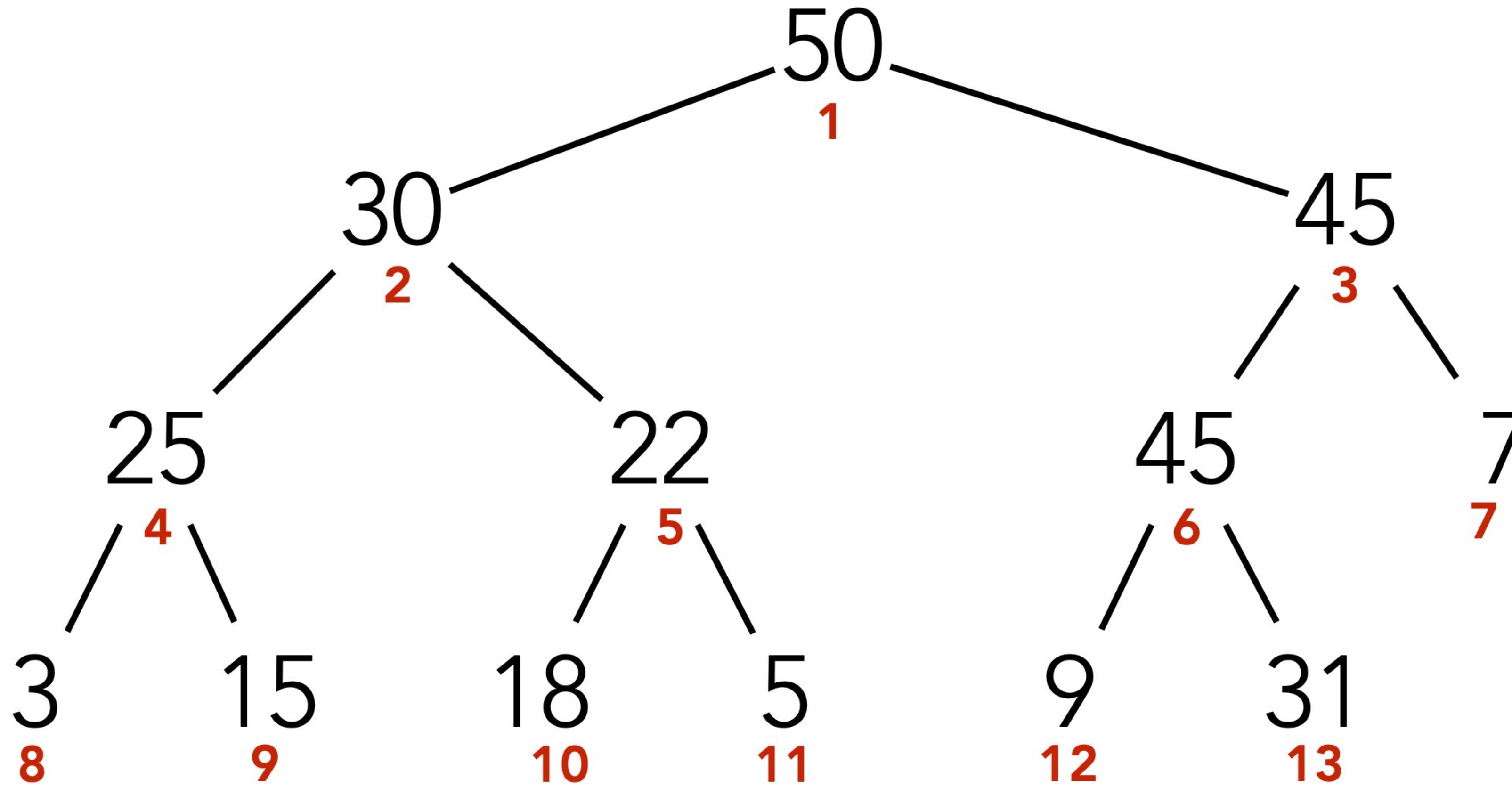
$i*2$

right\_child(i)

Complete tree ...

50	30	45	25	22	45	7	3	15	18	5	9	31
1	2	3	4	5	6	7	8	9	10	11	12	13

# Implementation



parent(i)

floor( $i/2$ )

left\_child(i)

$i*2$

right\_child(i)

$i*2 + 1$

Complete tree ...

50	30	45	25	22	45	7	3	15	18	5	9	31
1	2	3	4	5	6	7	8	9	10	11	12	13

insert

# Insert

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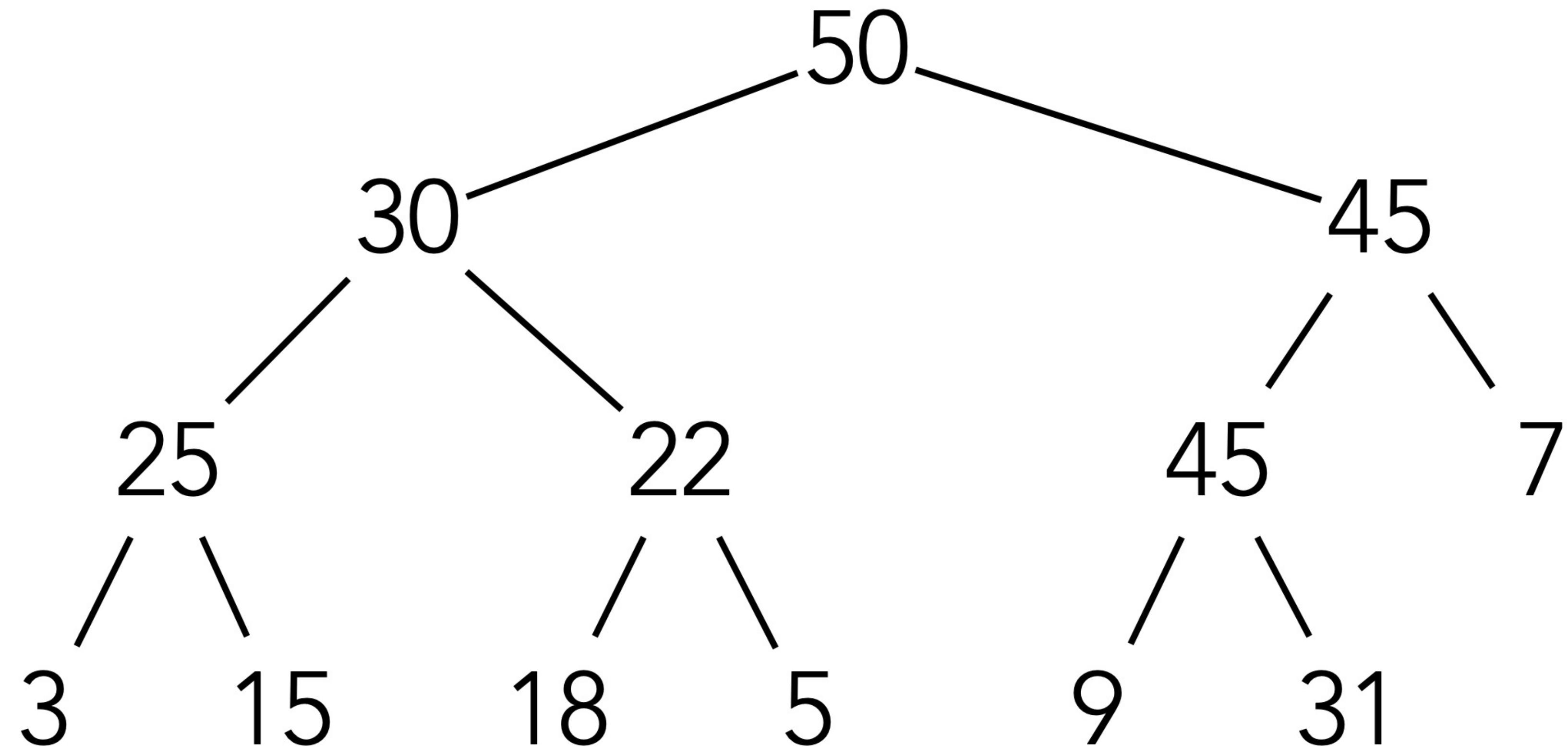
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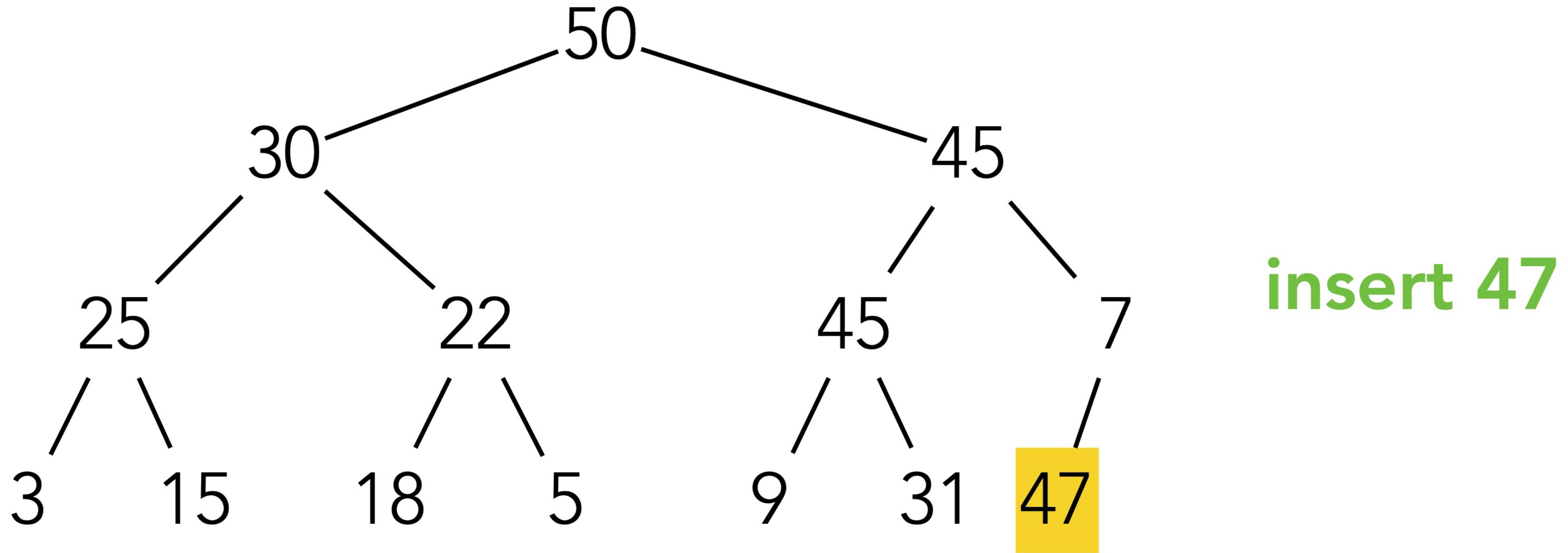
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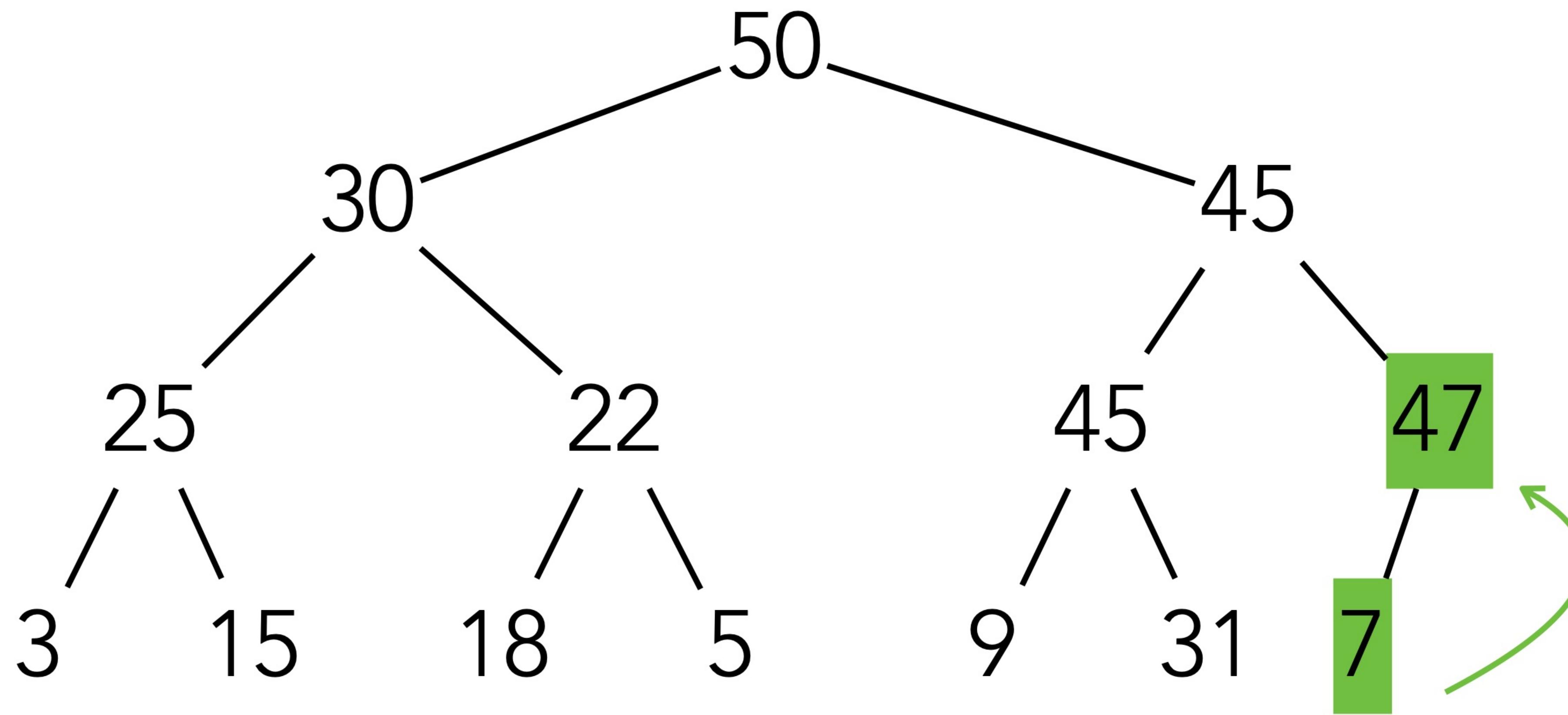
$O(\log n)$



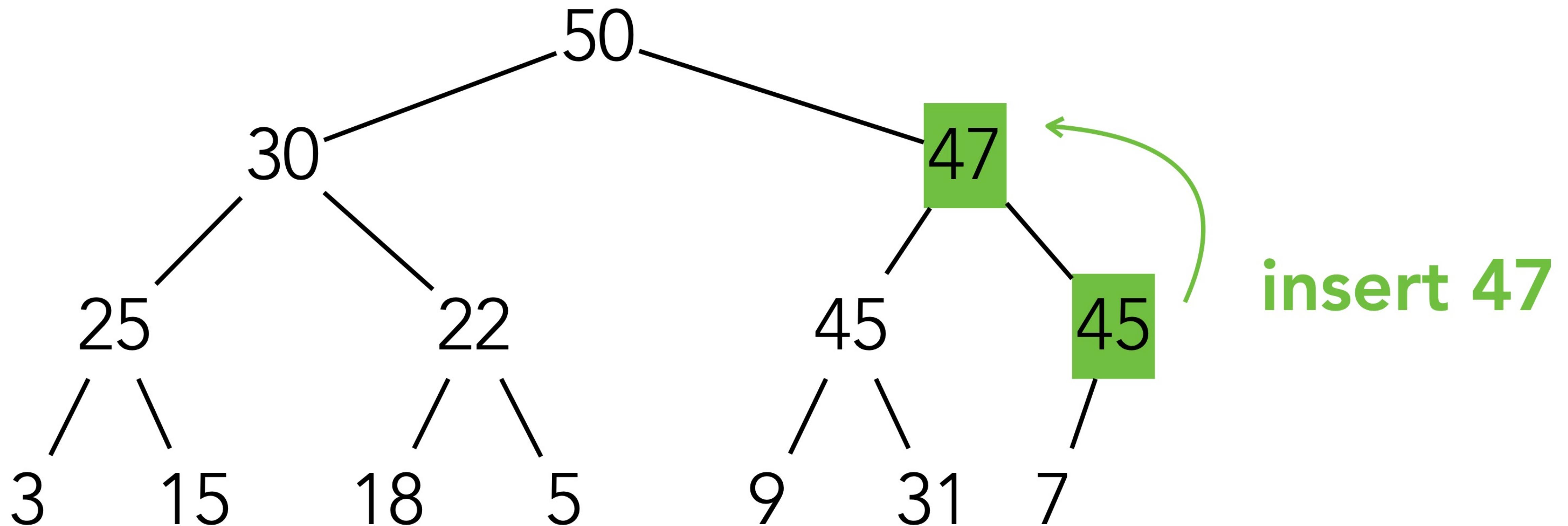
# insert 47



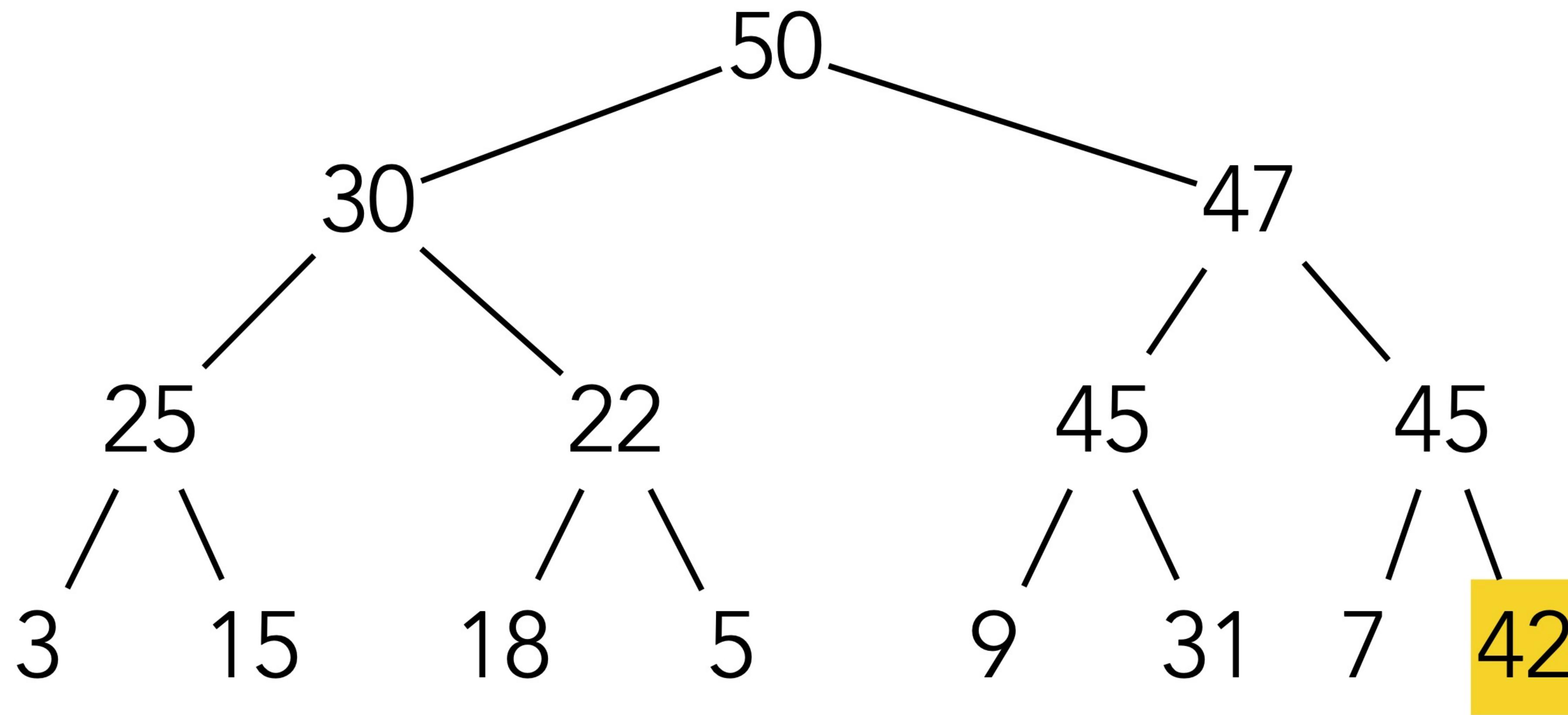
50	30	45	25	22	45	7	3	15	18	5	9	31	47		
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50	30	45	25	22	45	47	3	15	18	5	9	31	7		
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50	30	47	25	22	45	45	3	15	18	5	9	31	7		
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insert 42

50	30	47	25	22	45	45	3	15	18	5	9	31	7	42	
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**removeMax**

# removeMax

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Max element is the the **first** element of the array

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Max element is the **first** element of the array  
the root of the heap

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Copy last element of array to first position

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Copy last element of array to first position  
then decrement array size by 1 (removes last element)

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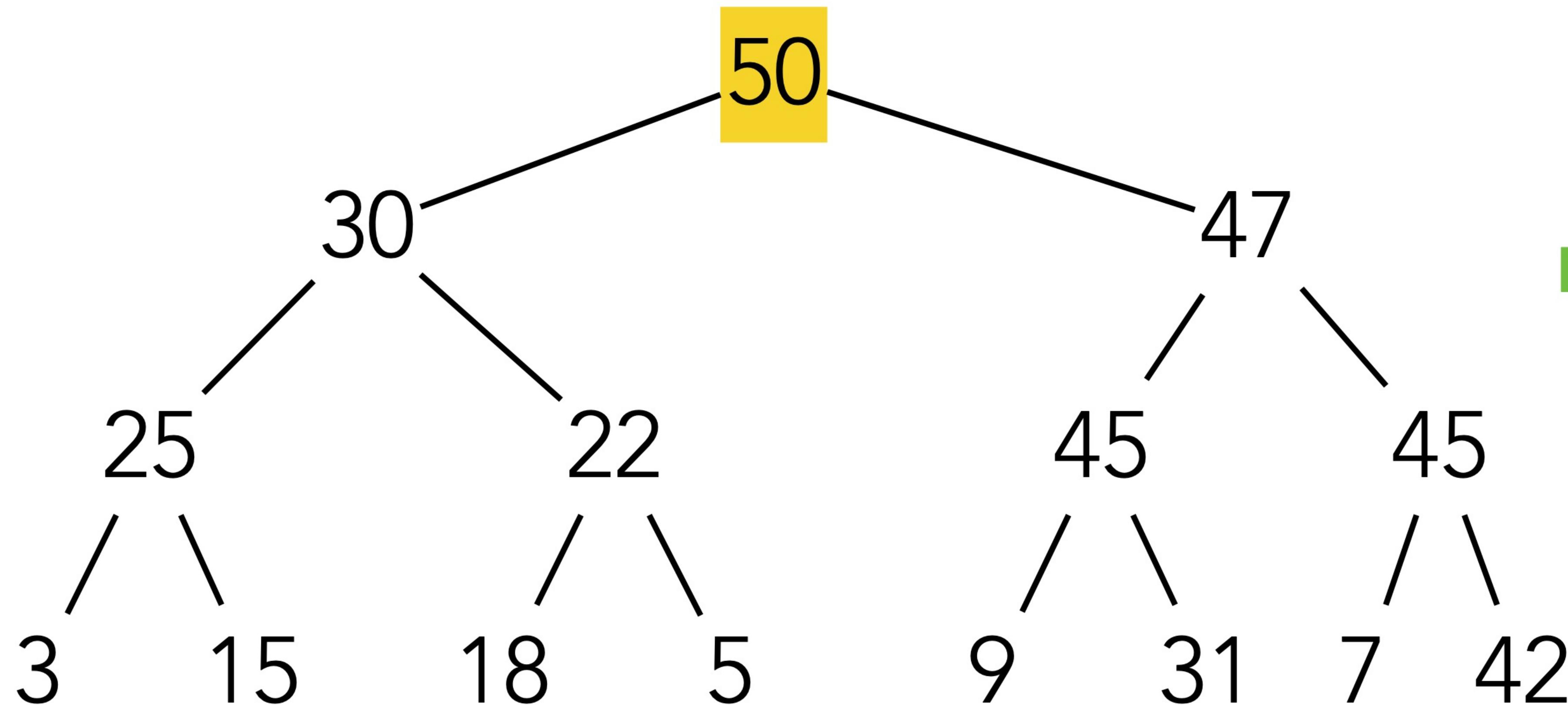
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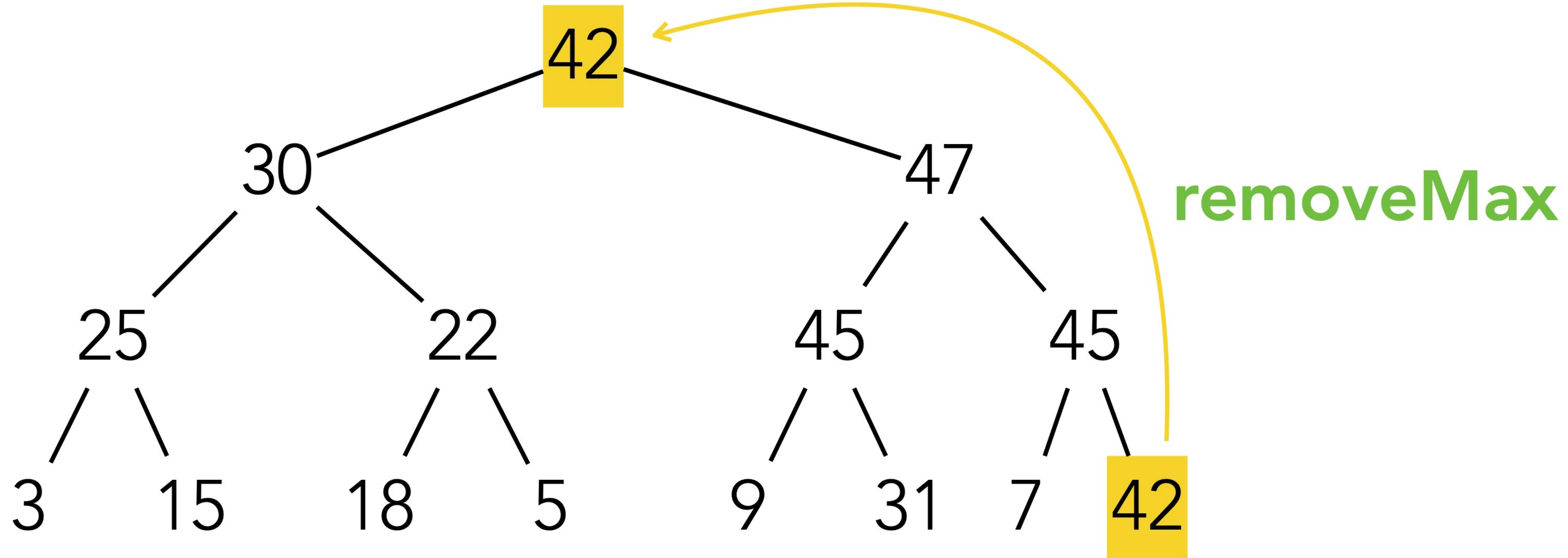
Check heap-order property  
if violated, **Down-Heap** (swap with **larger** child)  
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$O(\log n)$

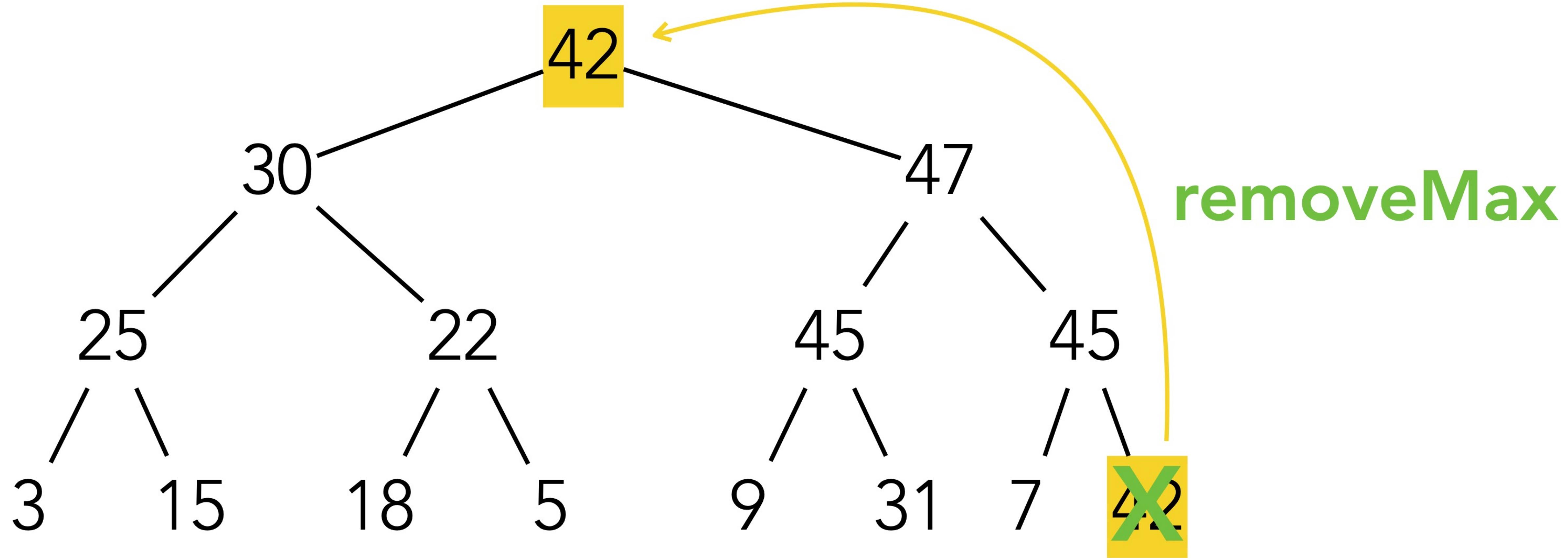


removeMax

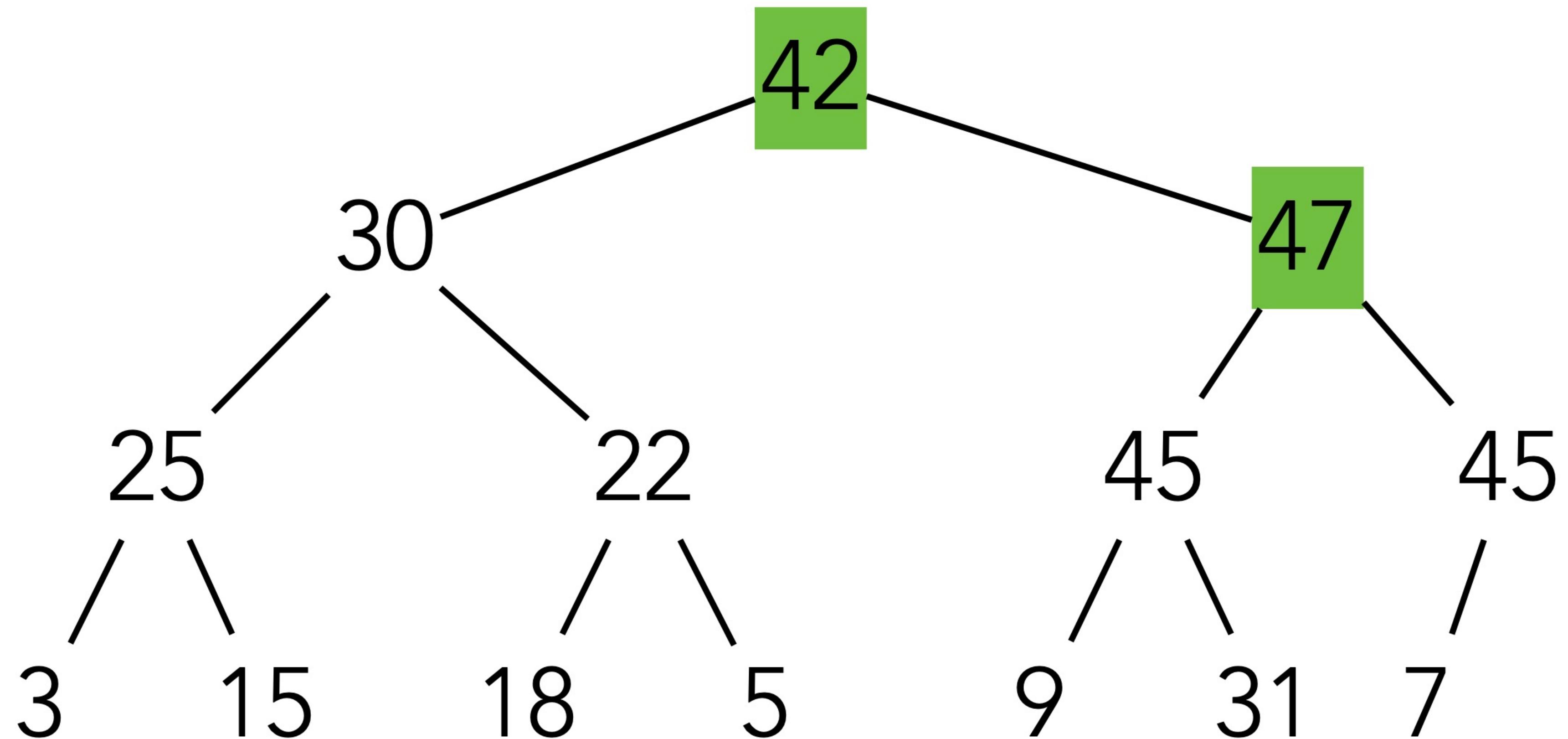
50	30	47	25	22	45	45	3	15	18	5	9	31	7	42	
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42	30	47	25	22	45	45	3	15	18	5	9	31	7	42	
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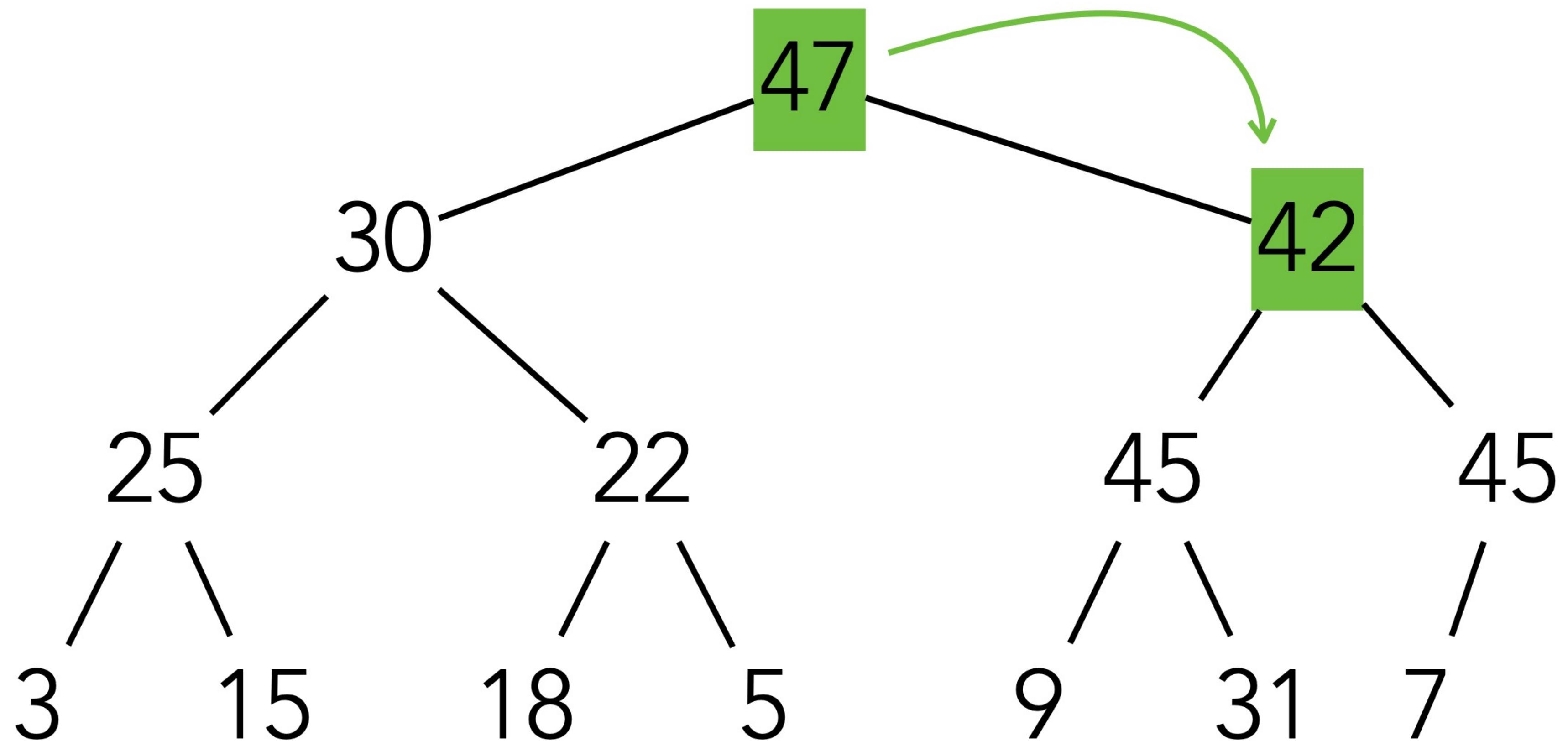


42	30	47	25	22	45	45	3	15	18	5	9	31	7	42	
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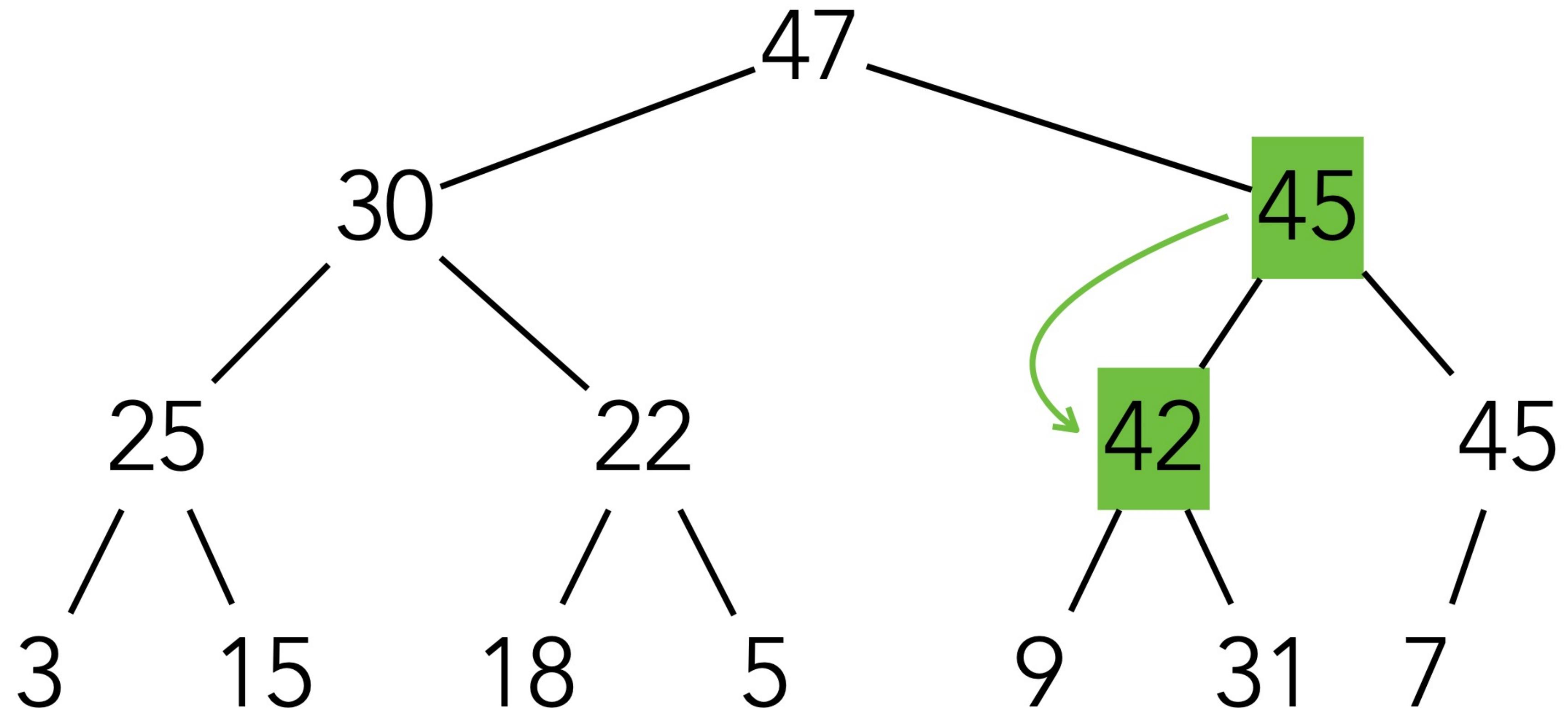
removeMax

42	30	47	25	22	45	45	3	15	18	5	9	31	7		
----	----	----	----	----	----	----	---	----	----	---	---	----	---	--	--



`removeMax`

47	30	42	25	22	45	45	3	15	18	5	9	31	7		
----	----	----	----	----	----	----	---	----	----	---	---	----	---	--	--



`removeMax`

47	30	45	25	22	42	45	3	15	18	5	9	31	7		
----	----	----	----	----	----	----	---	----	----	---	---	----	---	--	--

# Performance

	Sorted Array/List	Unsorted Array/ List	Heap
insert	$O(n)$	$O(1)$	
removeMax	$O(1)$	$O(n)$	
max	$O(1)$	$O(n)$	
insert N	$O(n^2)$	$O(n)$	

# Performance

	Sorted Array/List	Unsorted Array/ List	Heap
insert	O(n)	O(1)	O(log n)
removeMax	O(1)	O(n)	O(log n)
max	O(1)	O(n)	O(1)
insert N	O( $n^2$ )	O(n)	O(n)**

(\*\*) assuming we know the sequence in advance (**buildHeap**)