

# BLG335E Recitation 4

## Binomial Heaps

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05.12.2019

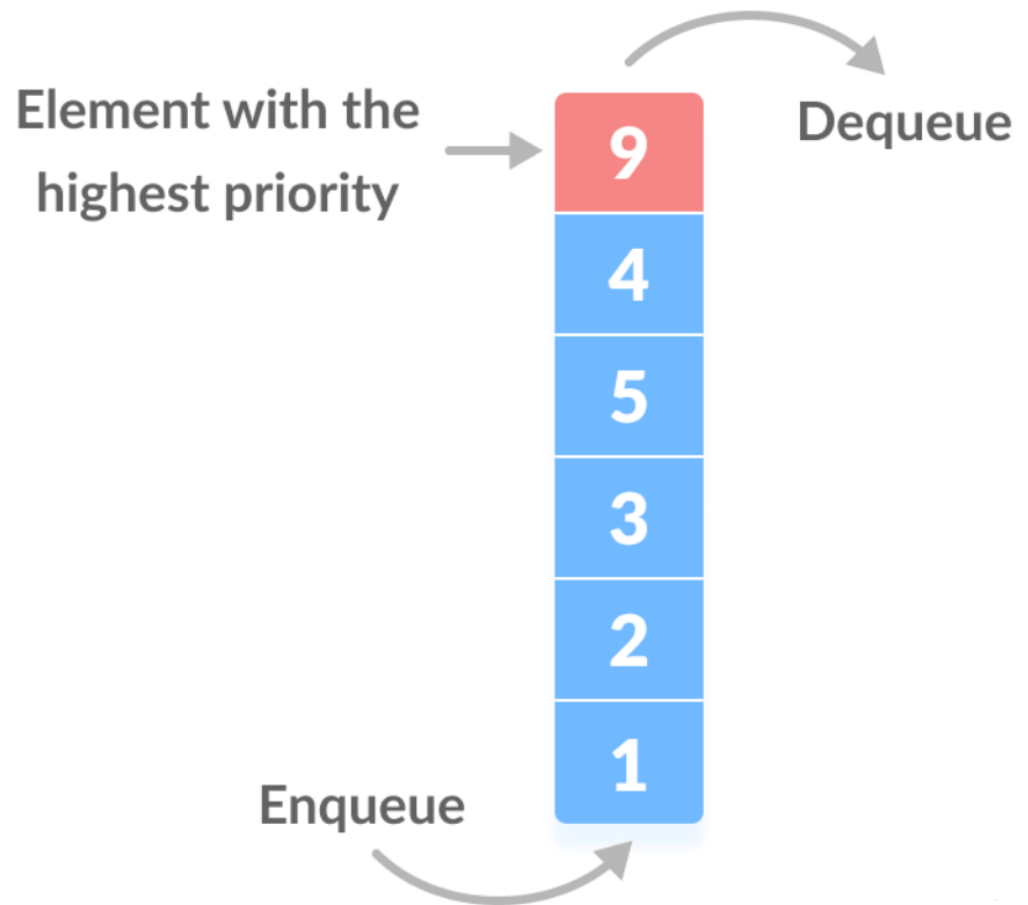
Course slides from  
Kevin Wayne @Princeton  
have been used in  
preparation of these slides.

# Contents

- What is Priority Queue?
- Binary Heaps
- Binomial Trees
- Binomial Heaps

# Priority Queues

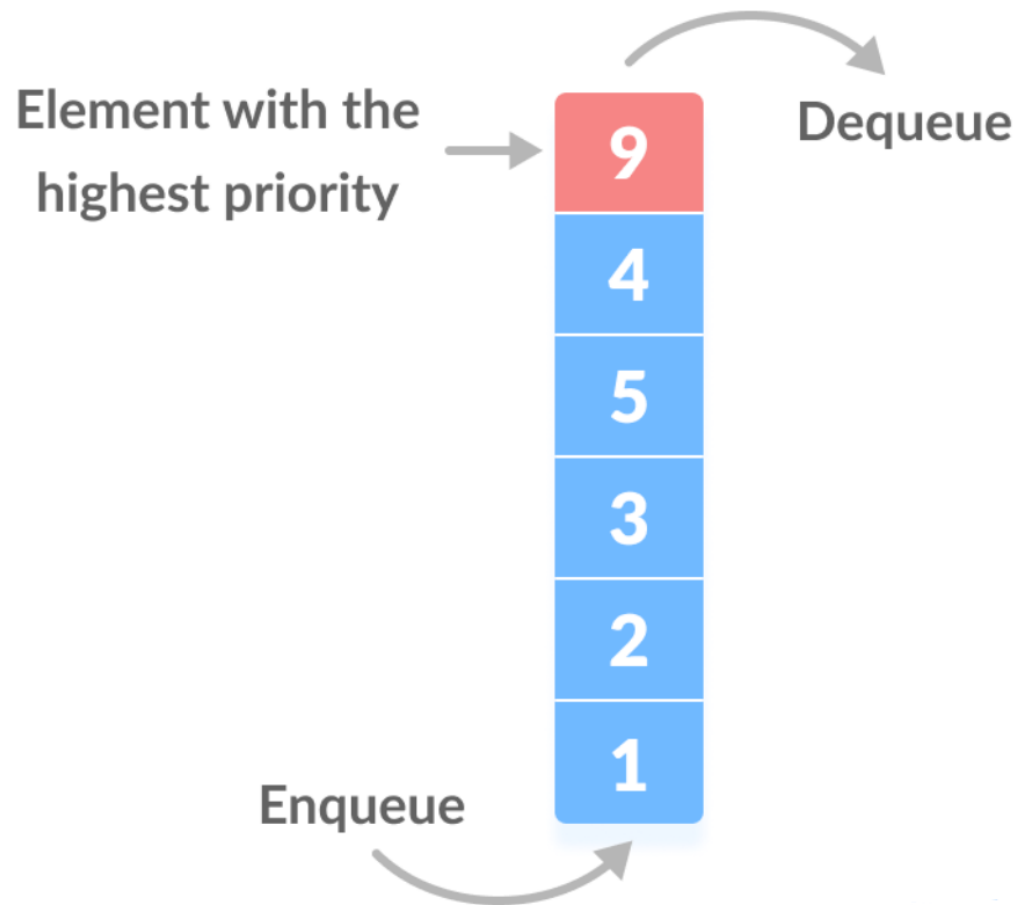
- A priority queue is a type of queue that assigns priority values to its elements.
- Instead of First-In-First-Out method, values with higher probabilities are dequeued first.
- If smaller values have more priority, which element would be at the top of the queue?  
**Element with minimum key**



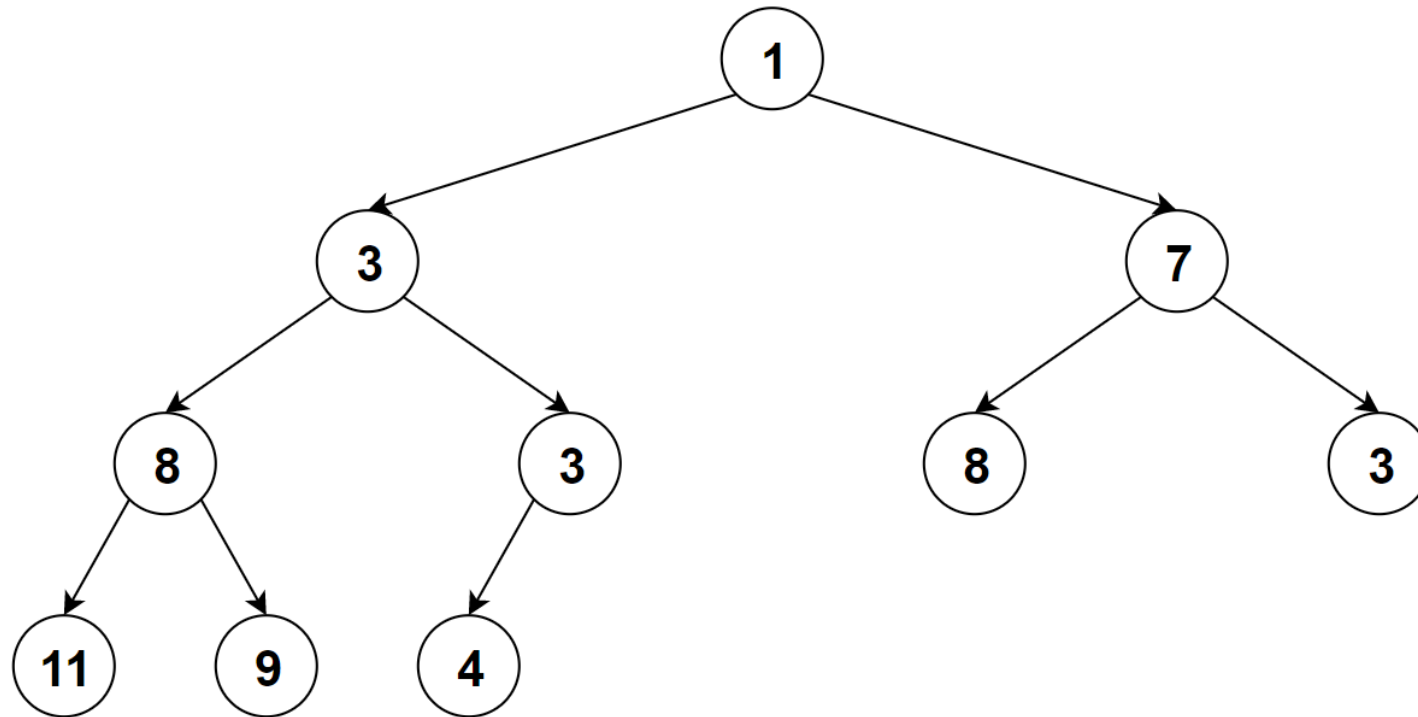
# Priority Queues

A priority queue should support following operations:

- Insert an element to the queue
- Pop the minimum element from the queue
- Decrease key of an element



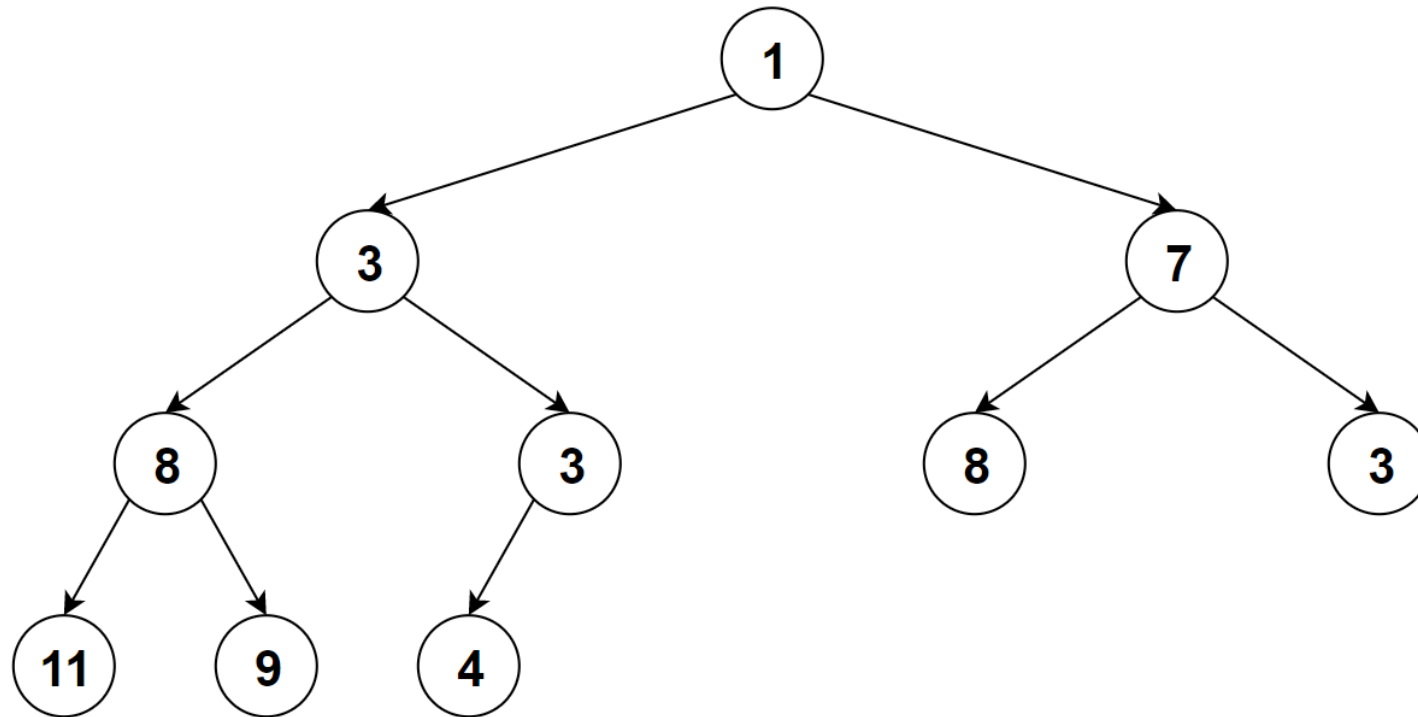
# Binary Heap



Binary Heap is a type of priority queue.

- It is a complete binary tree: All levels are filled, except possibly the last level

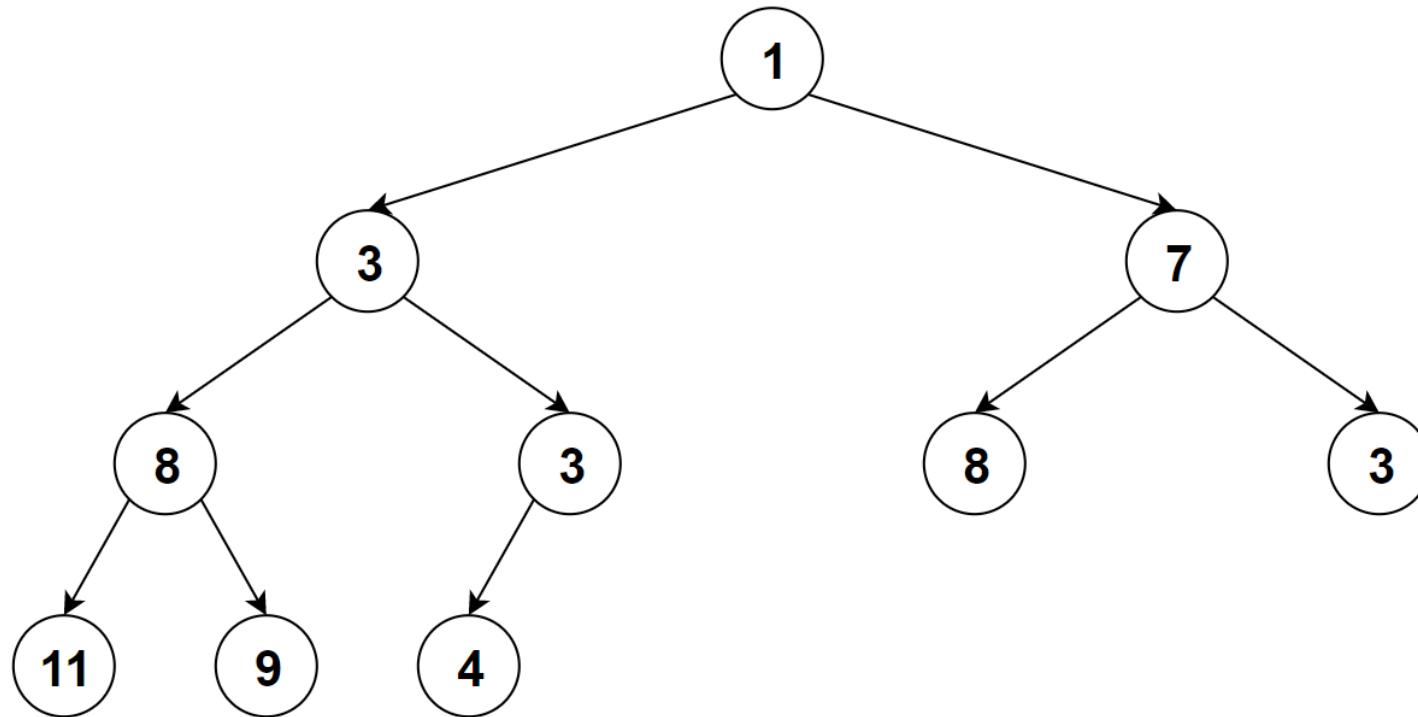
# Binary Heap



Satisfies the heap property: Key of each node is smaller than the key of its children nodes(min heap):

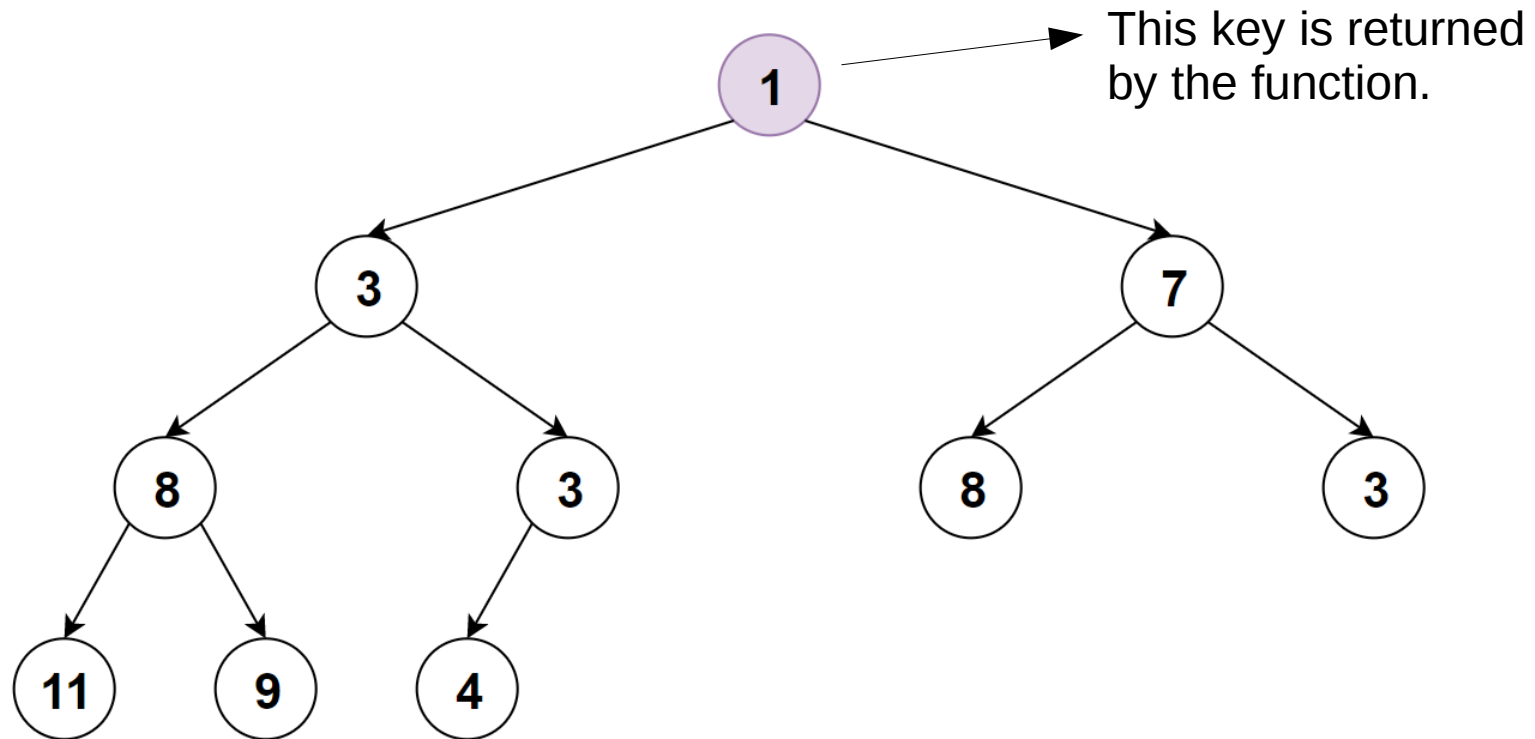
$$key(a) \geq key(parent(a))$$

# Binary Heap – extract\_min



`extract_min()`: Delete the root item and return it.

# Binary Heap – extract\_min

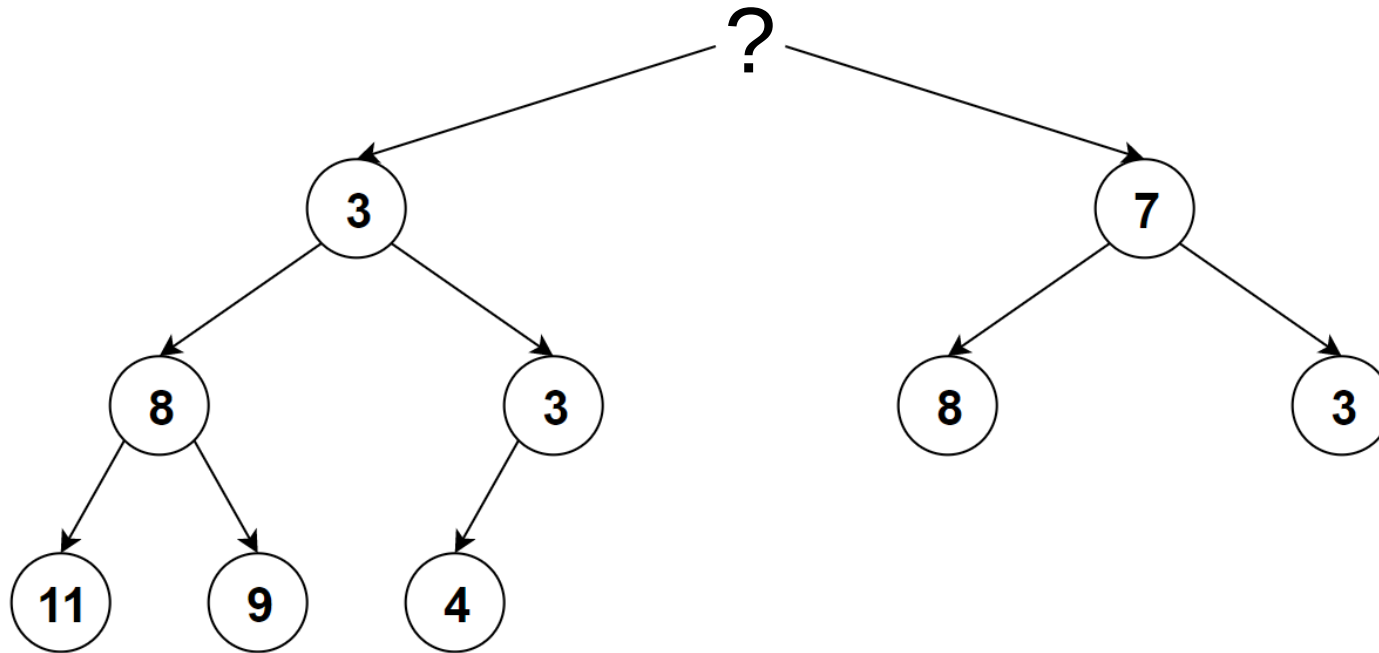


`extract_min()`: Pop the minimum element from the heap.



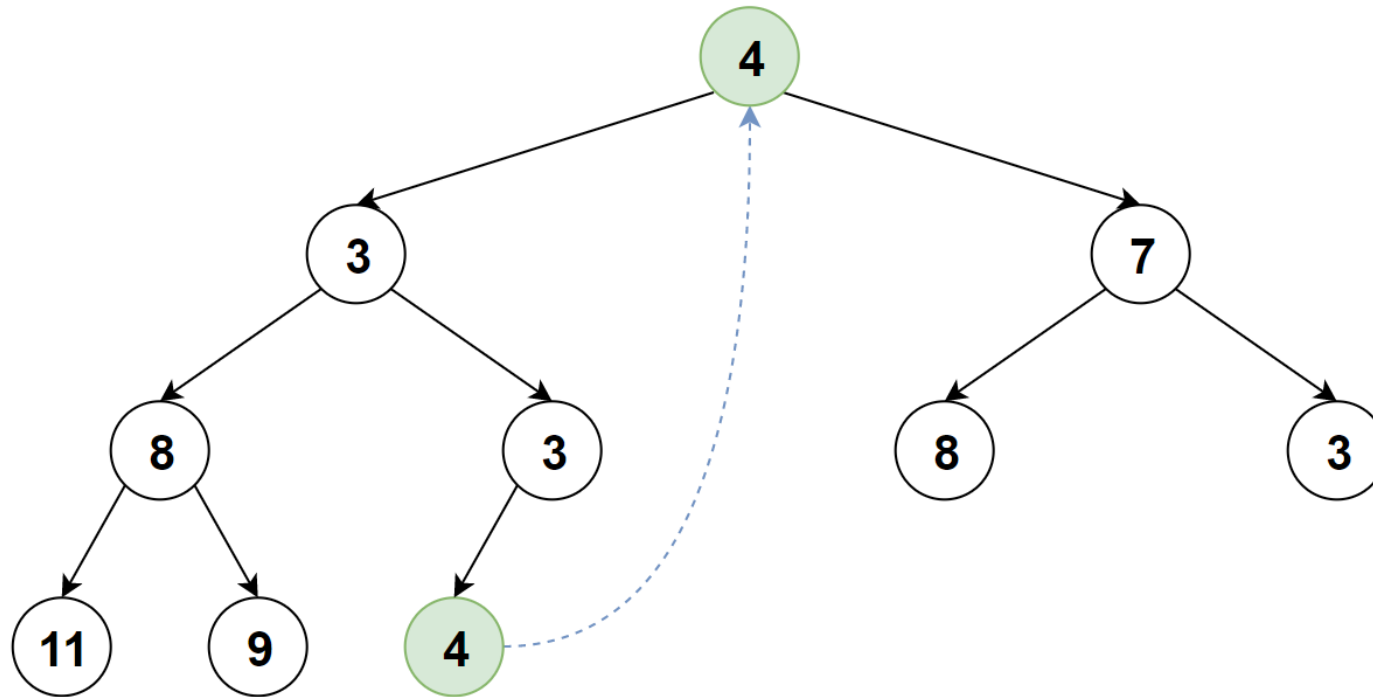
# Binary Heap – extract\_min

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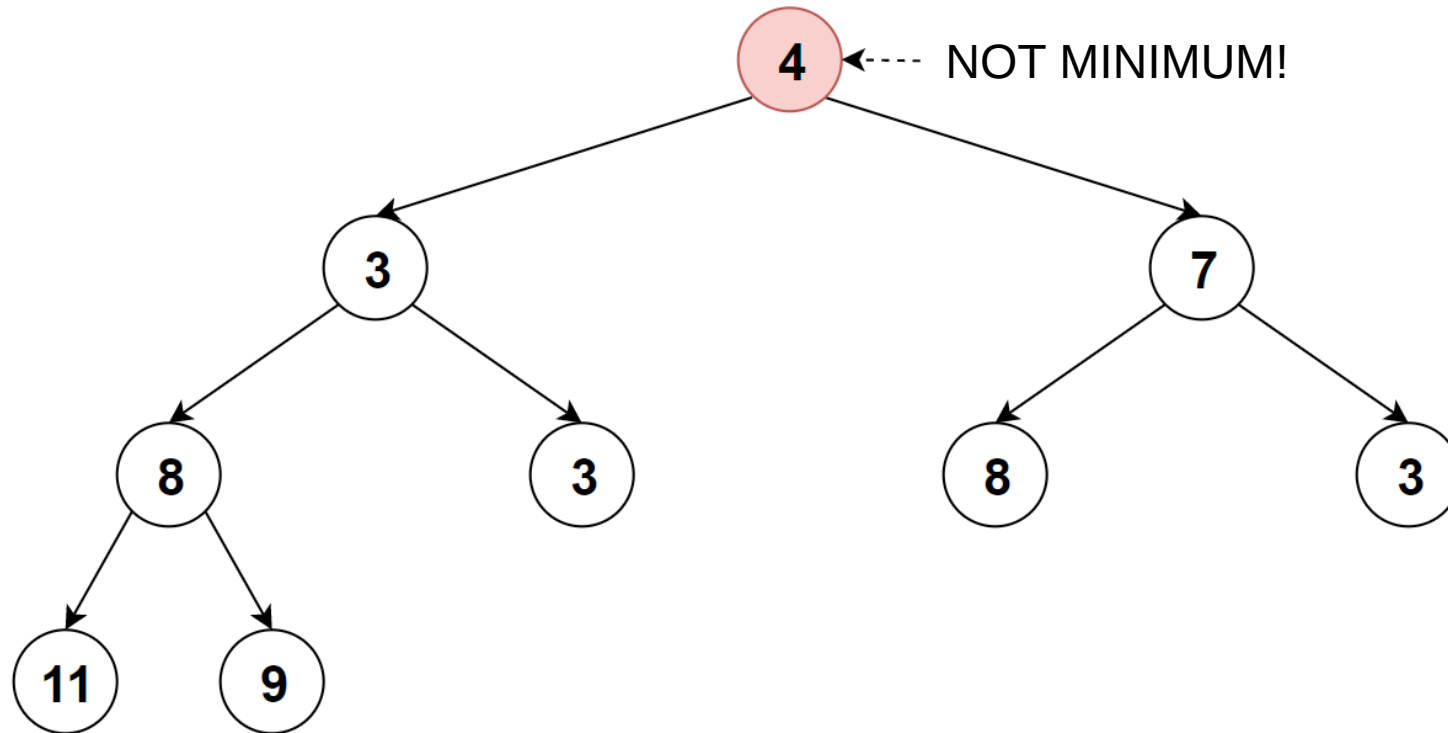
`extract_min()`: Pop the minimum element from the heap. **Now, we need to replace root!**

# Binary Heap – extract\_min



Replace root with the **last leaf element!**

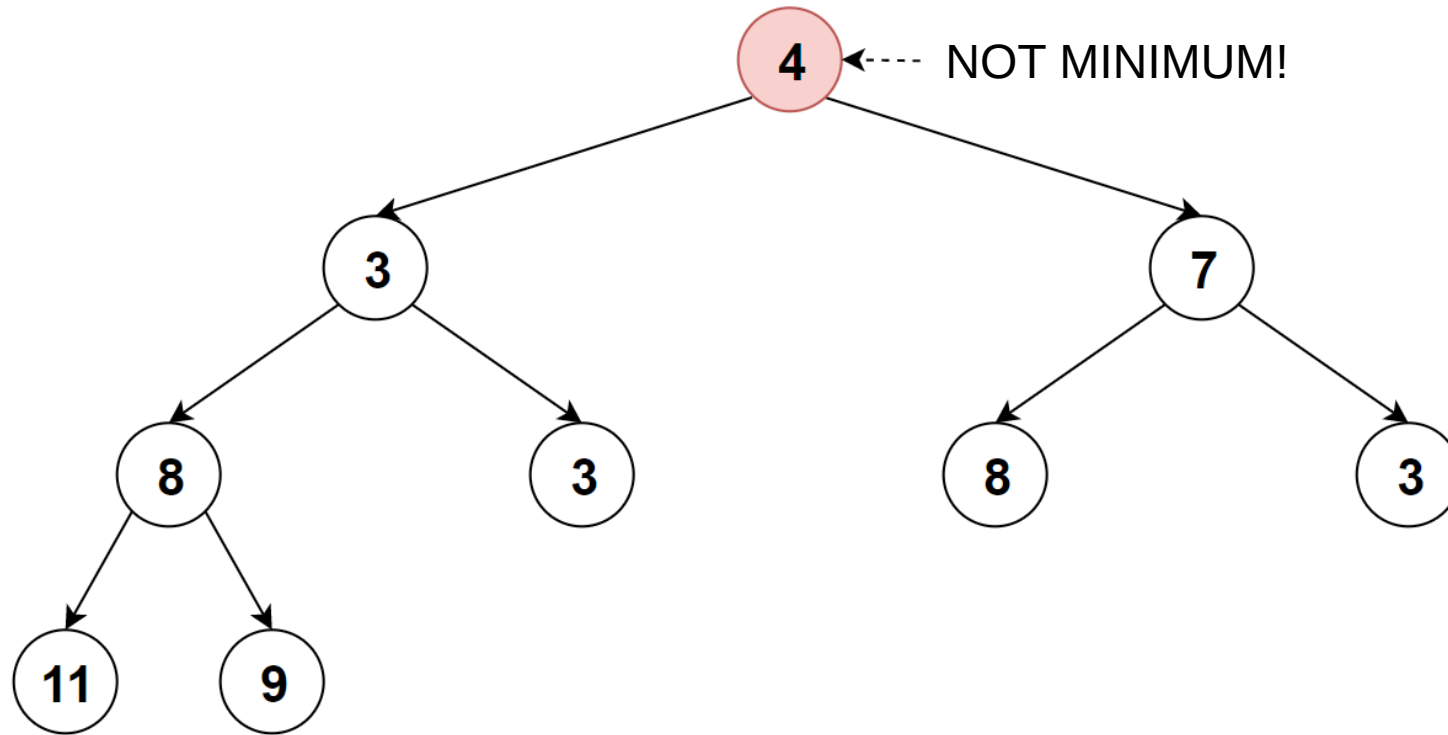
# Binary Heap – extract\_min



However, the root is not minimum now,  
therefore heap property does not hold anymore!

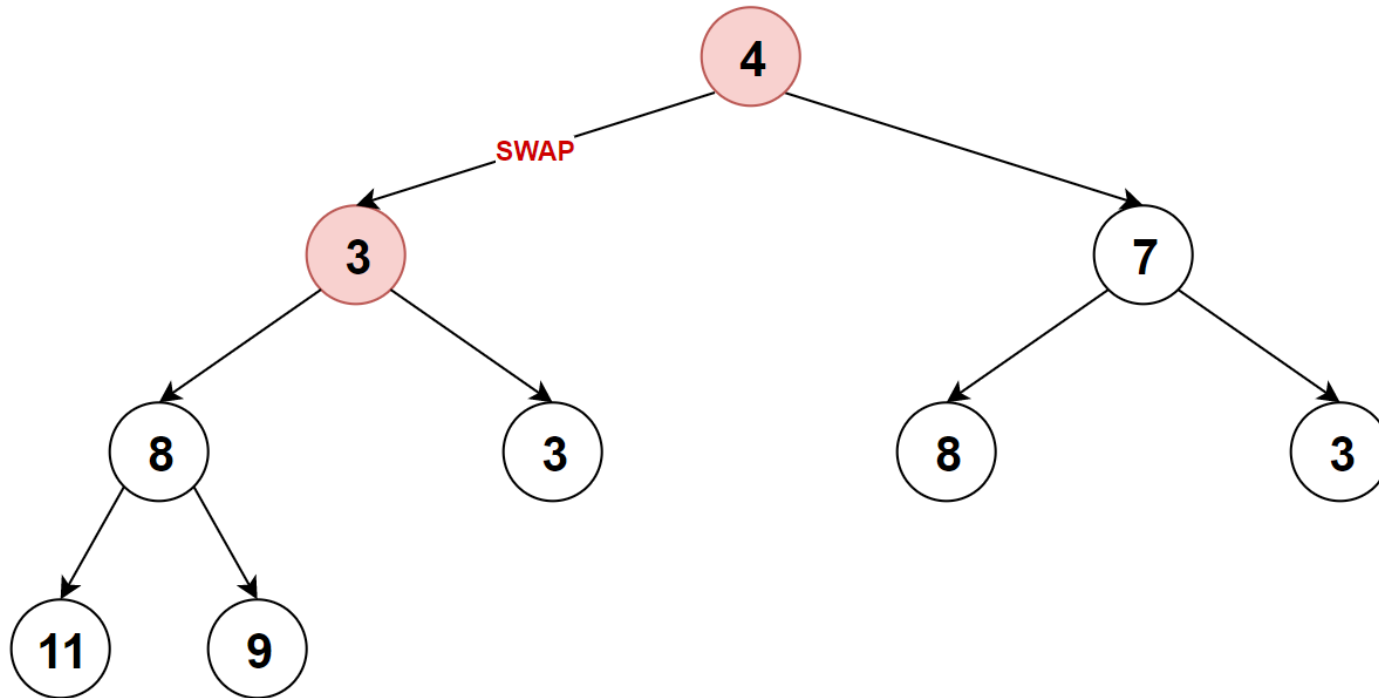
We need to fix it!

# Binary Heap – extract\_min



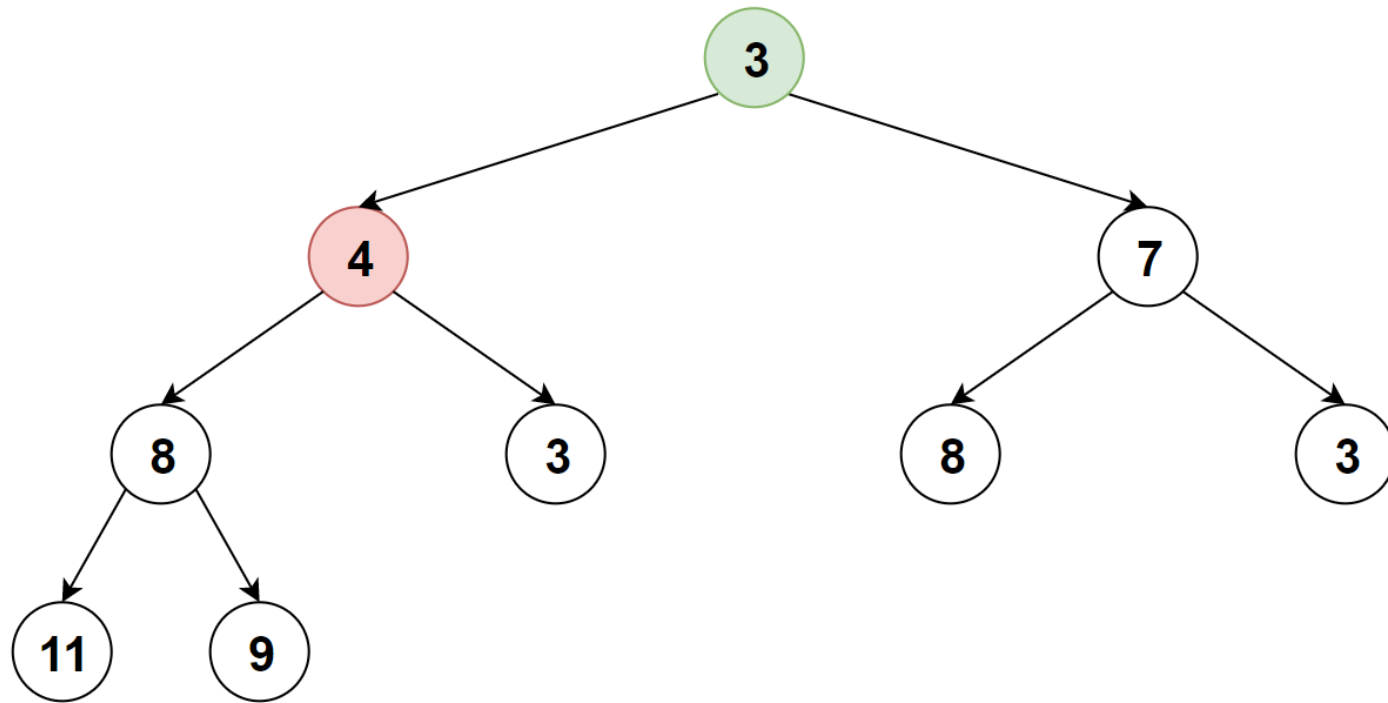
Until the **key 4** is smaller than or equal to its children, we need to swap it with its smallest child key.

# Binary Heap – extract\_min



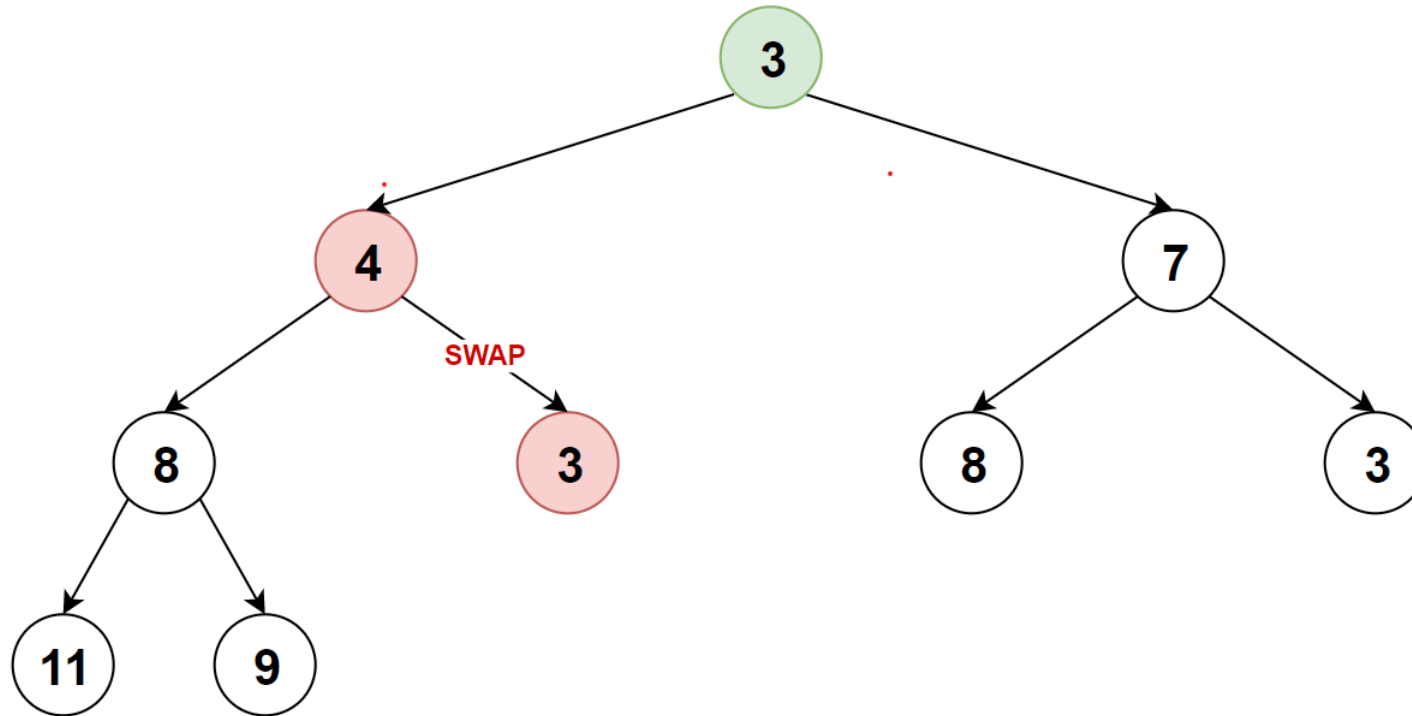
Until the **key 4** is smaller than or equal to its children, we need to swap it with its smallest child key. -> **SWAP 4 <-> 3**

# Binary Heap – extract\_min



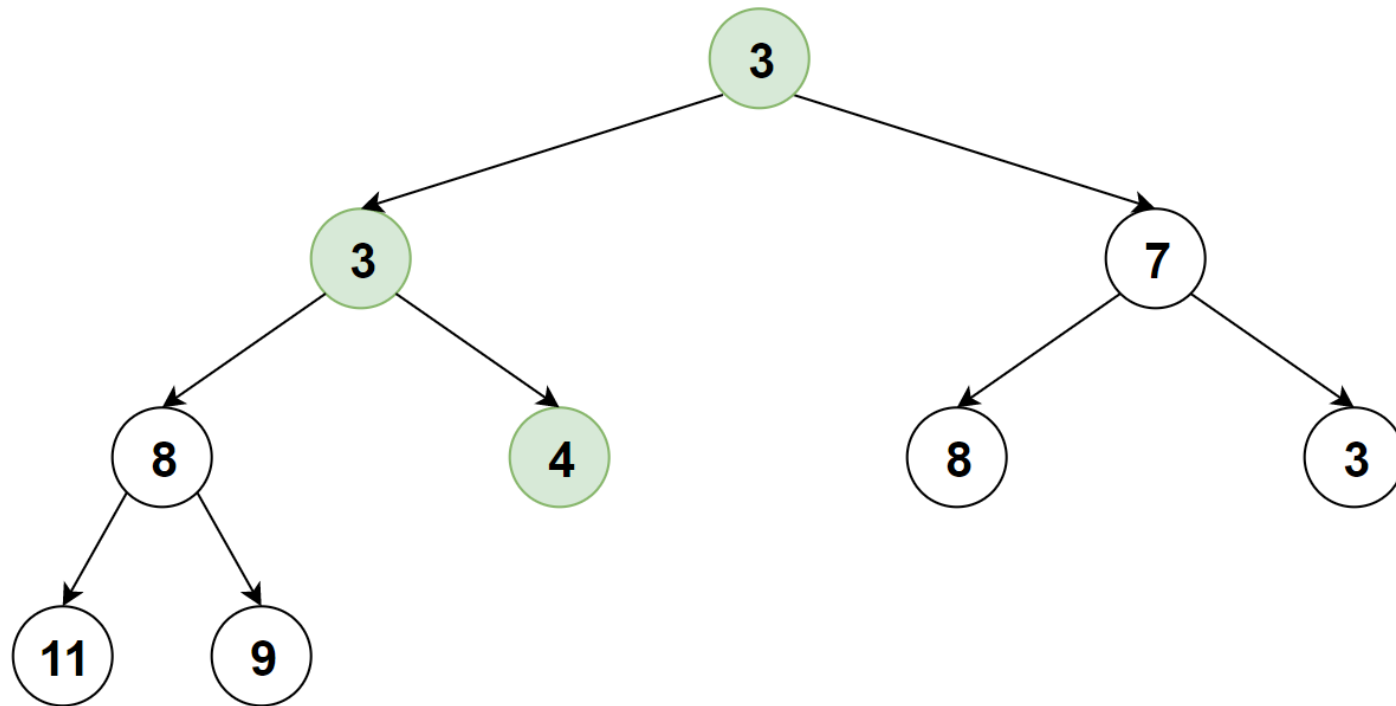
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# Binary Heap – extract\_min



Until the **key 4** is smaller than or equal to its children, we need to swap it with its smallest child key. -> **SWAP 4 <-> 3**

# Binary Heap – extract\_min

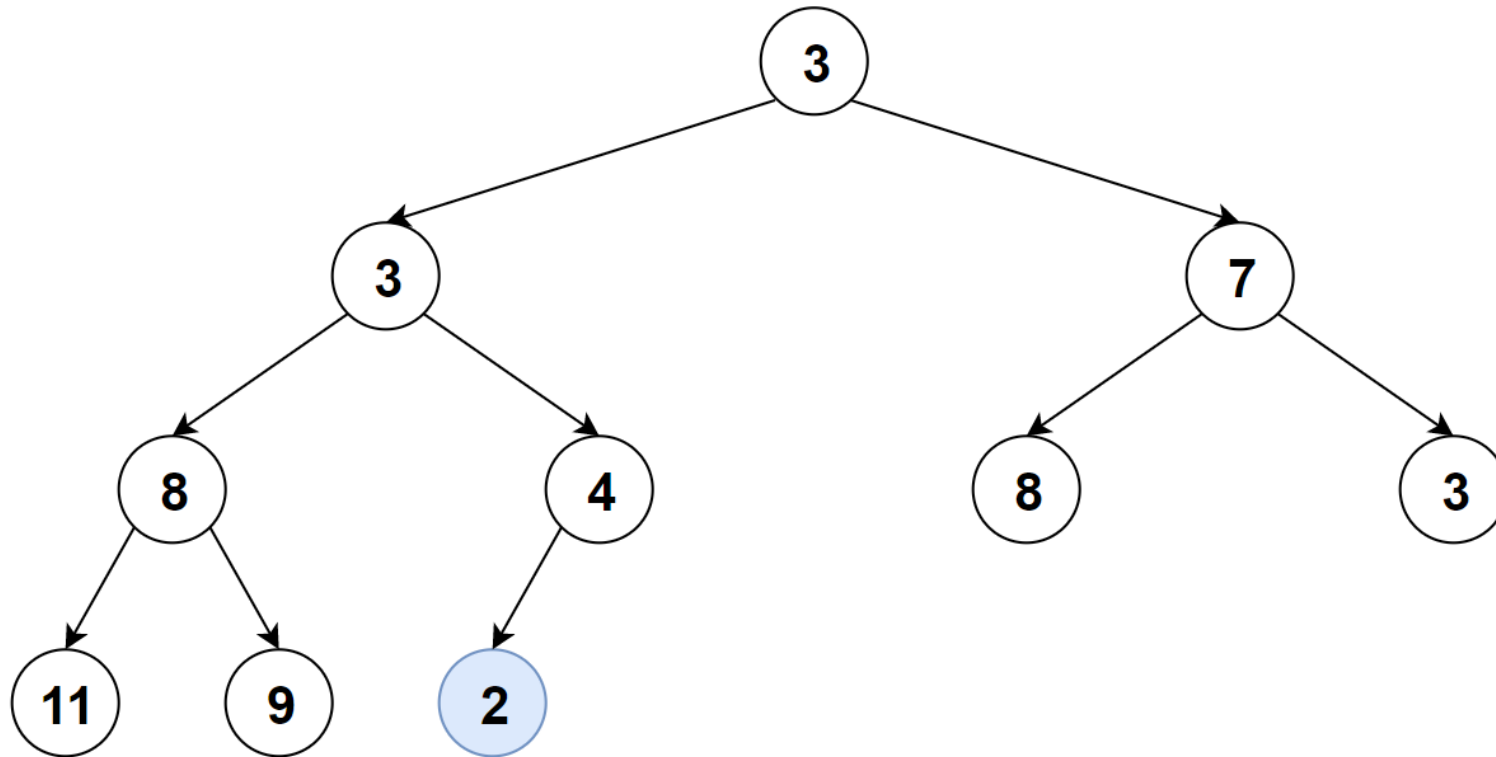


Now the heap property is satisfied! `extract_min()` function finishes by returning **key 1** (The root in the beginning).

- Time complexity?  $O(\log n)$

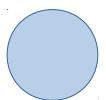


# Binary Heap - insert

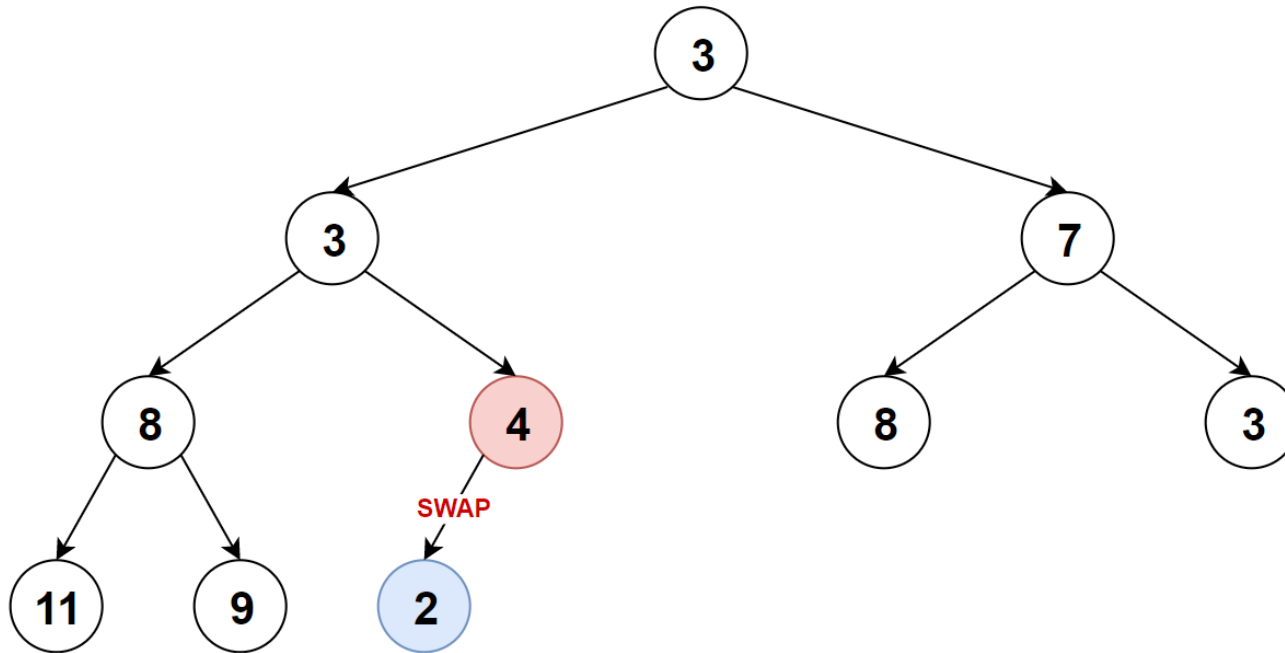


insert(): inserts a new key as the very last leaf key.

But, heap property is again gone! Now, we need to keep swapping **key 2** with its parent until heap property is satisfied!



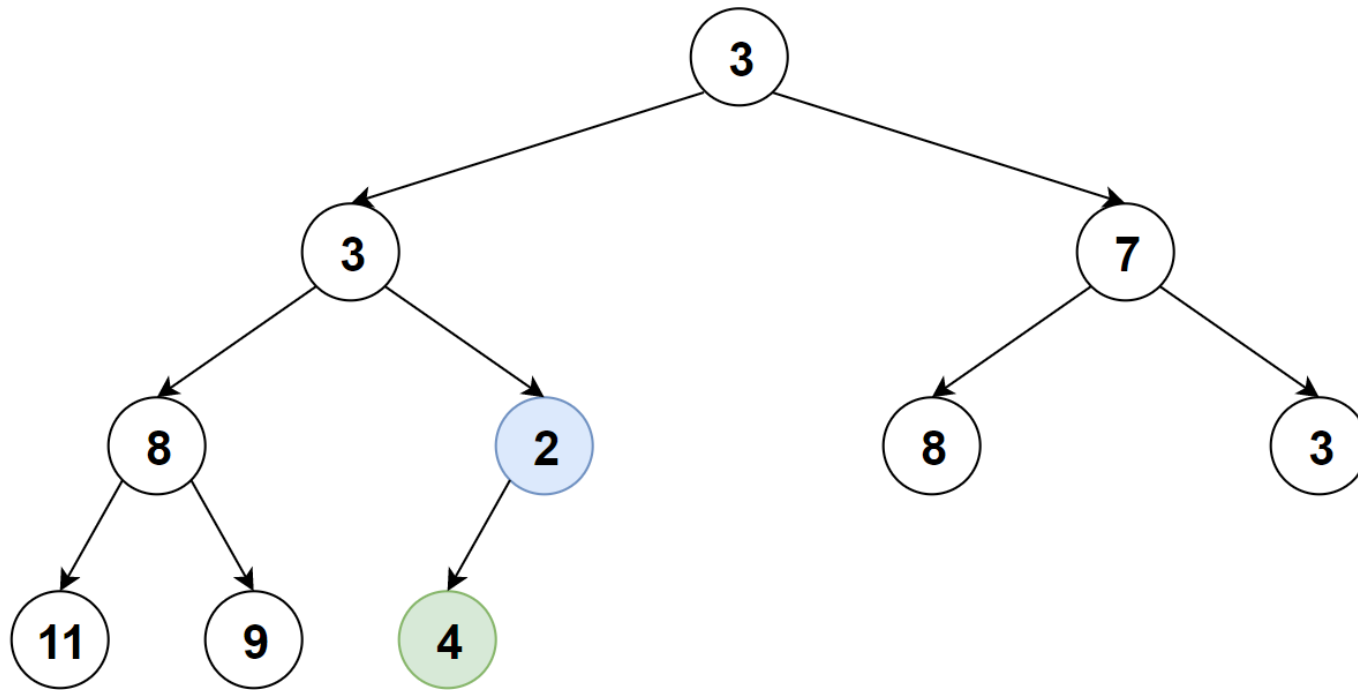
# Binary Heap - insert



**SWAP 2 <-> 4**

Now, we need to keep swapping **key 2** with its parent until heap property is satisfied!

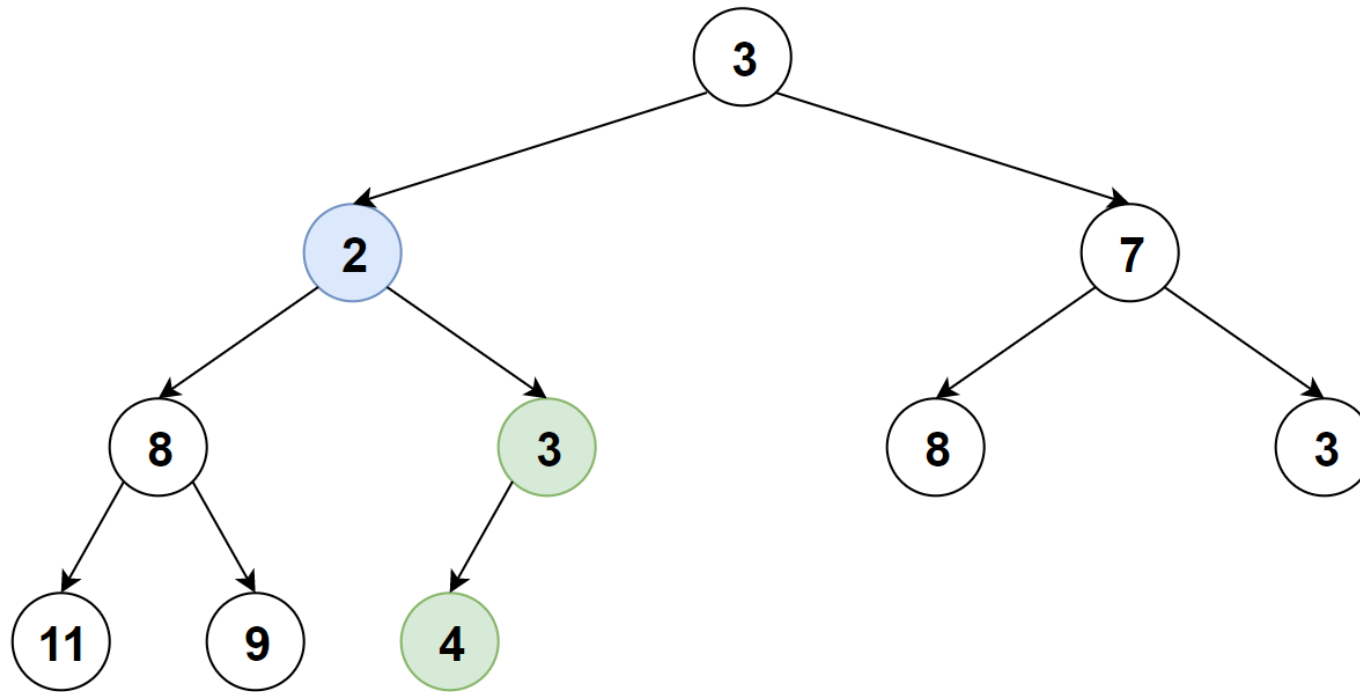
# Binary Heap - insert



**SWAP 2 <-> 3**

Now, we need to keep swapping **key 2** with its parent until heap property is satisfied!

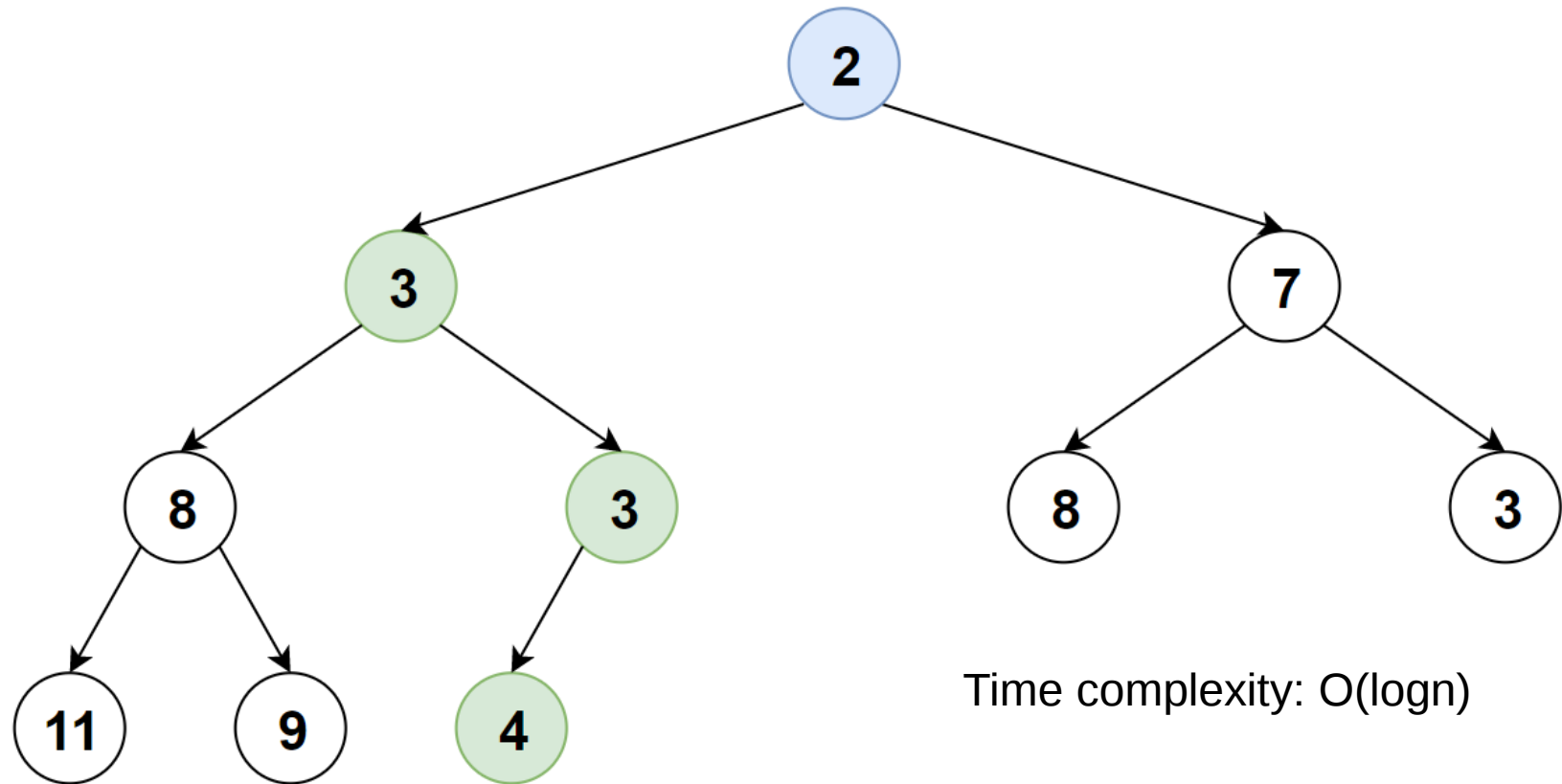
# Binary Heap - insert



**SWAP 2 <-> 3**

Now, we need to keep swapping **key 2** with its parent until heap property is satisfied!

# Binary Heap - insert



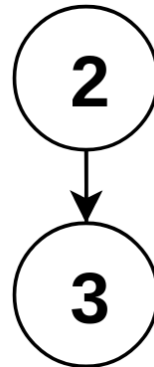
The heap property is satisfied! Insertion of **key 2** is complete!

- Decrease\_key operation decreases the key of an element, then performs the same bubble up operations as in “insert” operation.

# Binomial Tree



A tree of order 0

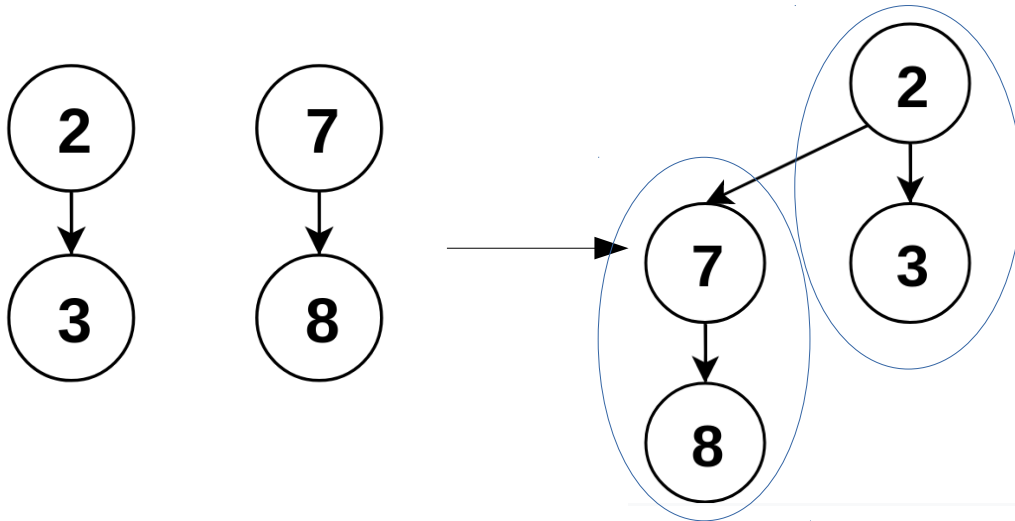


Two trees of order 0      →      A tree of order 1

Binomial tree is a set of nodes such that :

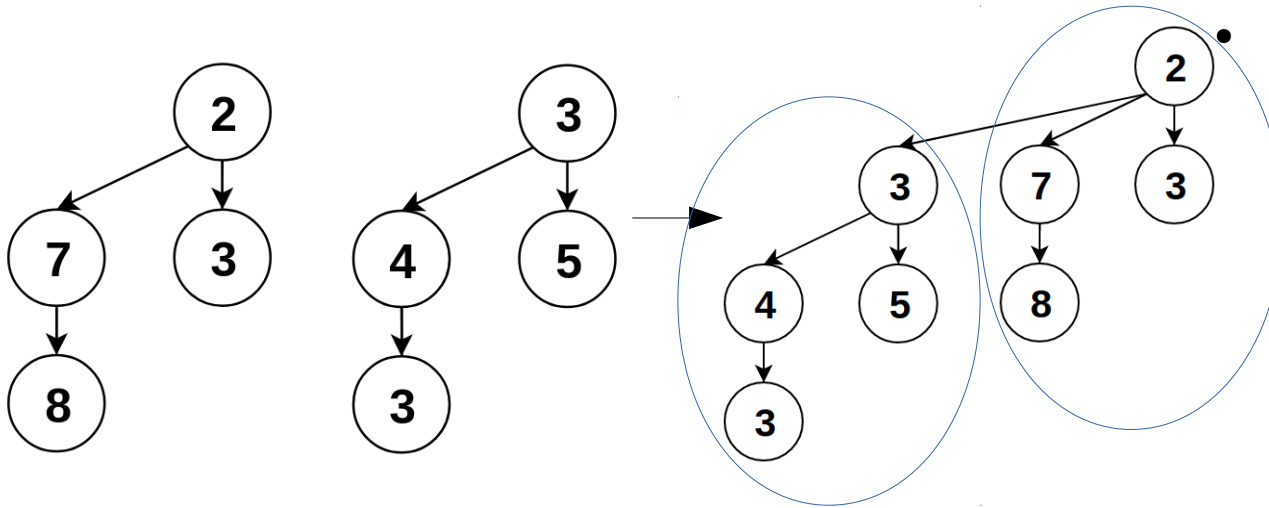
- A tree of order 0 is a single node and
- A tree of order  $k$  is combination of two trees of order  $k-1$ . To combine, one of the trees becomes the leftmost child of the other.

# Binomial Tree



Two trees of order 1 → A tree of order 2

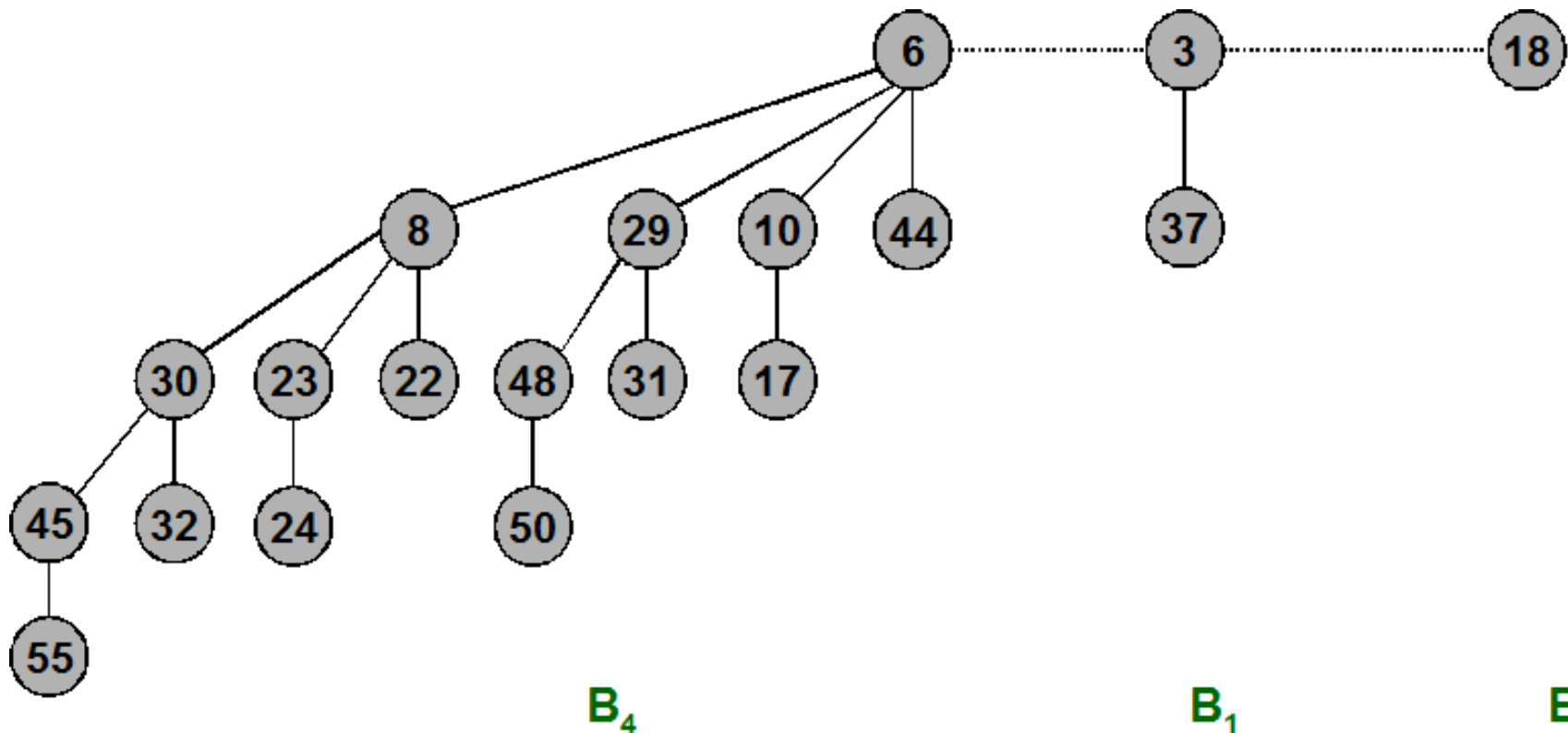
- If the order of binomial tree is  $k$ , then:
- It has  $2^k$  elements.
  - Degree of root is  $k$ , a.k.a the root has  $k$  children.
  - Its depth is  $k$
  - Each child of root is a binomial tree with orders  $0, 1, 2, \dots, k-1$ .



Two trees of order 2 → A tree of order 3

# Binomial Heap

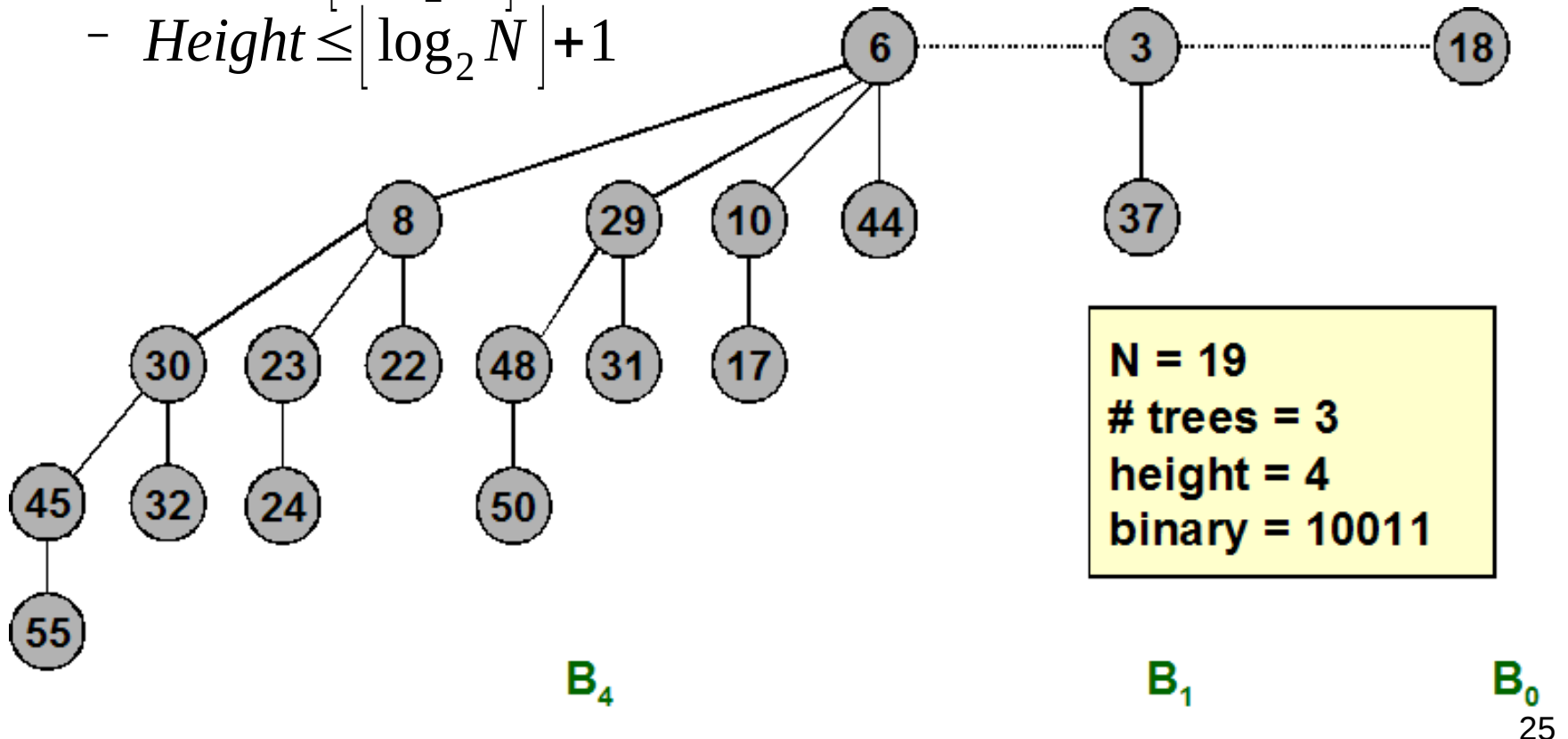
- Vuillemin, 1978
- Sequence of binomial trees that satisfy binomial heap property
  - each tree is min-heap ordered
  - 0 or 1 binomial tree of order  $k$





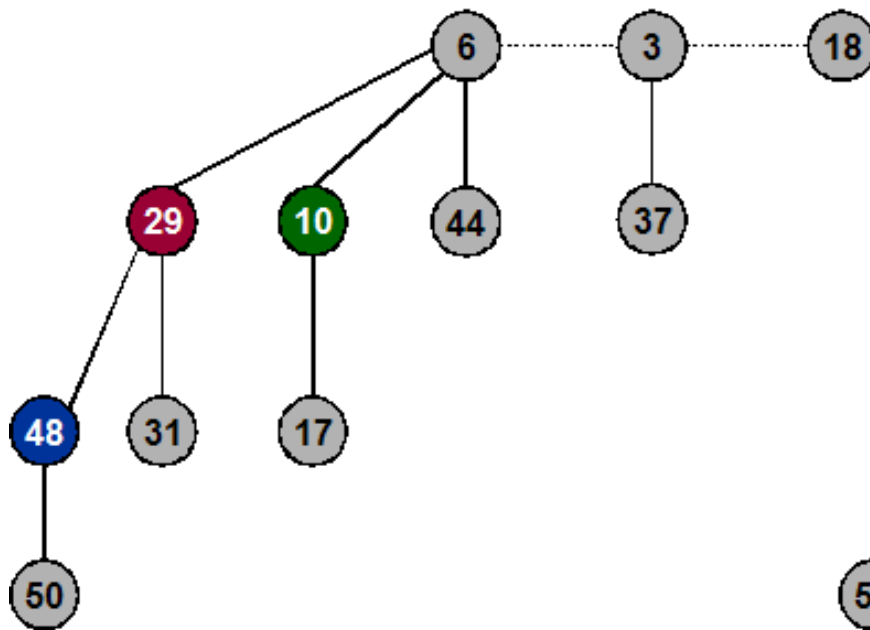
# Binomial Heap: Properties

- Properties of N-node binomial heap
  - Min key contained in root of  $B_0, B_1, \dots, B_k$
  - Contains binomial tree  $B_i$  iff  $b_i = 1$  where  $b_n \cdot b_2 b_1 b_0$  is binary representation of  $N$
  - At most  $\lfloor \log_2 N \rfloor + 1$  binomial trees
  - $Height \leq \lfloor \log_2 N \rfloor + 1$

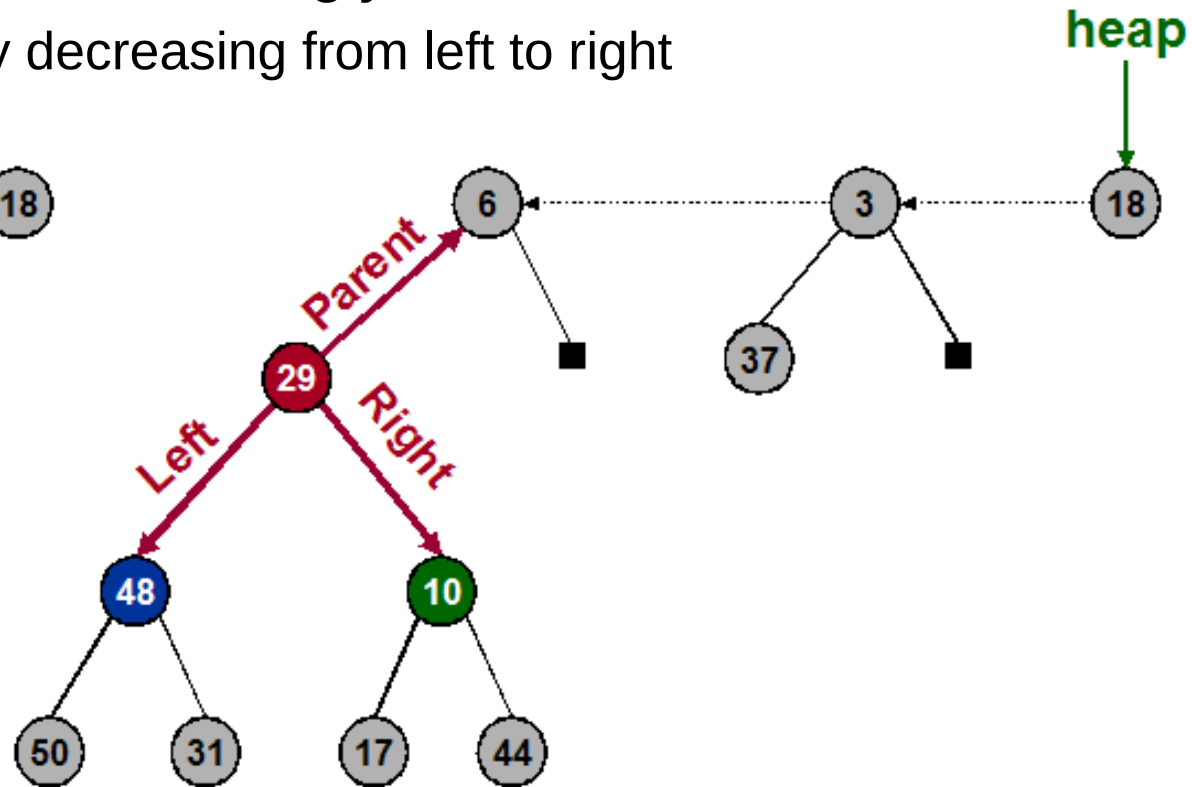


# Binomial Heap: Implementation

- Represent trees using left-child, right sibling pointers [Ch. 10.4]
  - three links per node (parent, left, right)
- Roots of trees connected with singly linked list
  - degrees of trees strictly decreasing from left to right



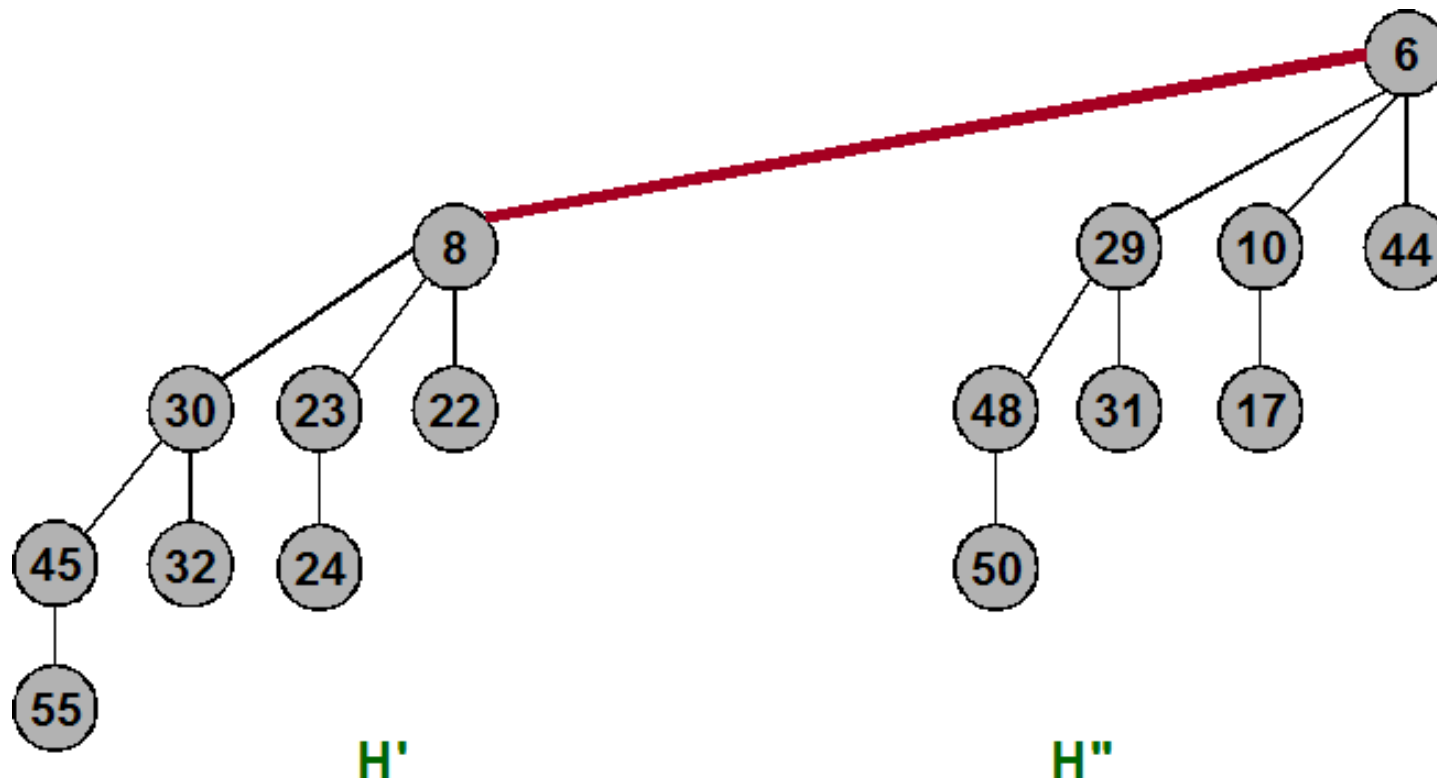
**Binomial Heap**



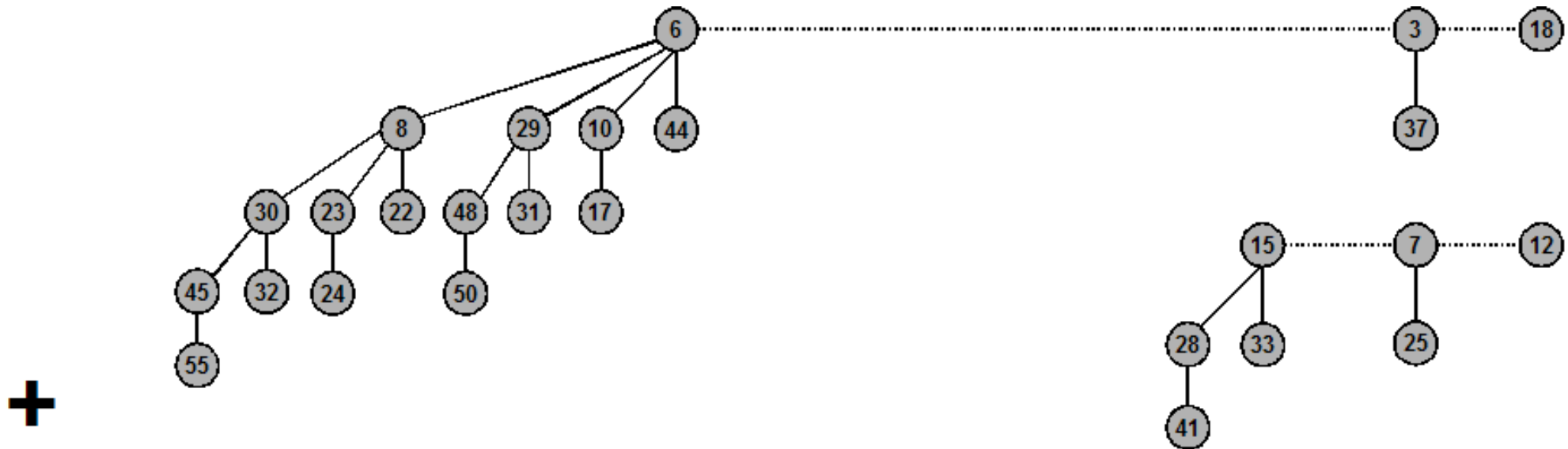
**Leftist Power-of-2 Heap**

# Binomial Heap: Union

- Create heap H that is union of heaps H' and H''
  - "Mergeable heaps"
  - Easy if H' and H'' are each order k binomial trees
    - connect roots of H' and H''
    - choose smaller key to be root of H



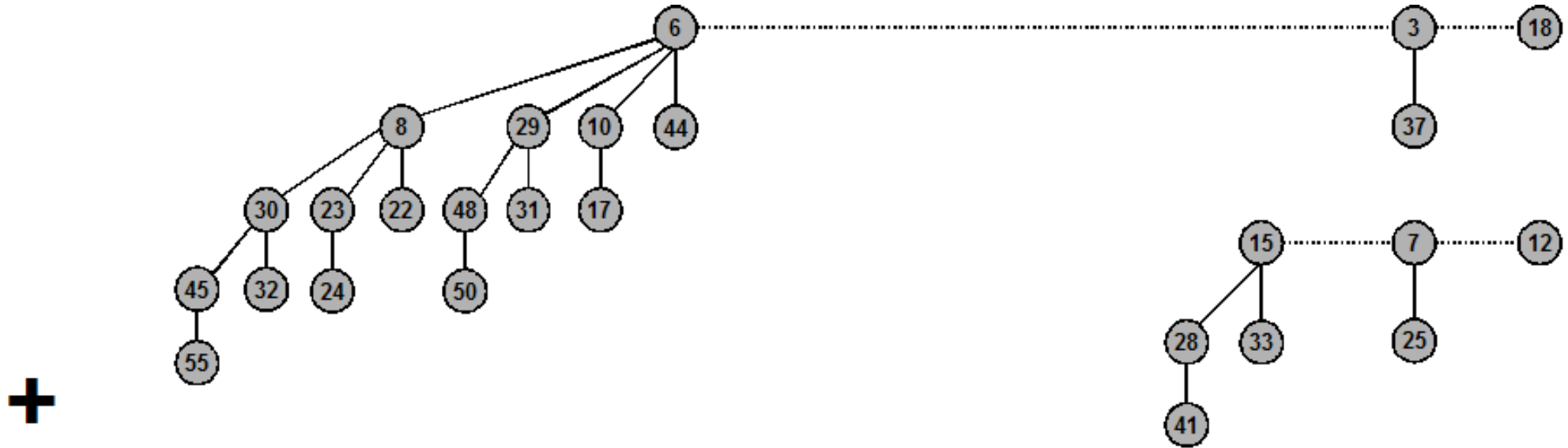
# Binomial Heap: Union



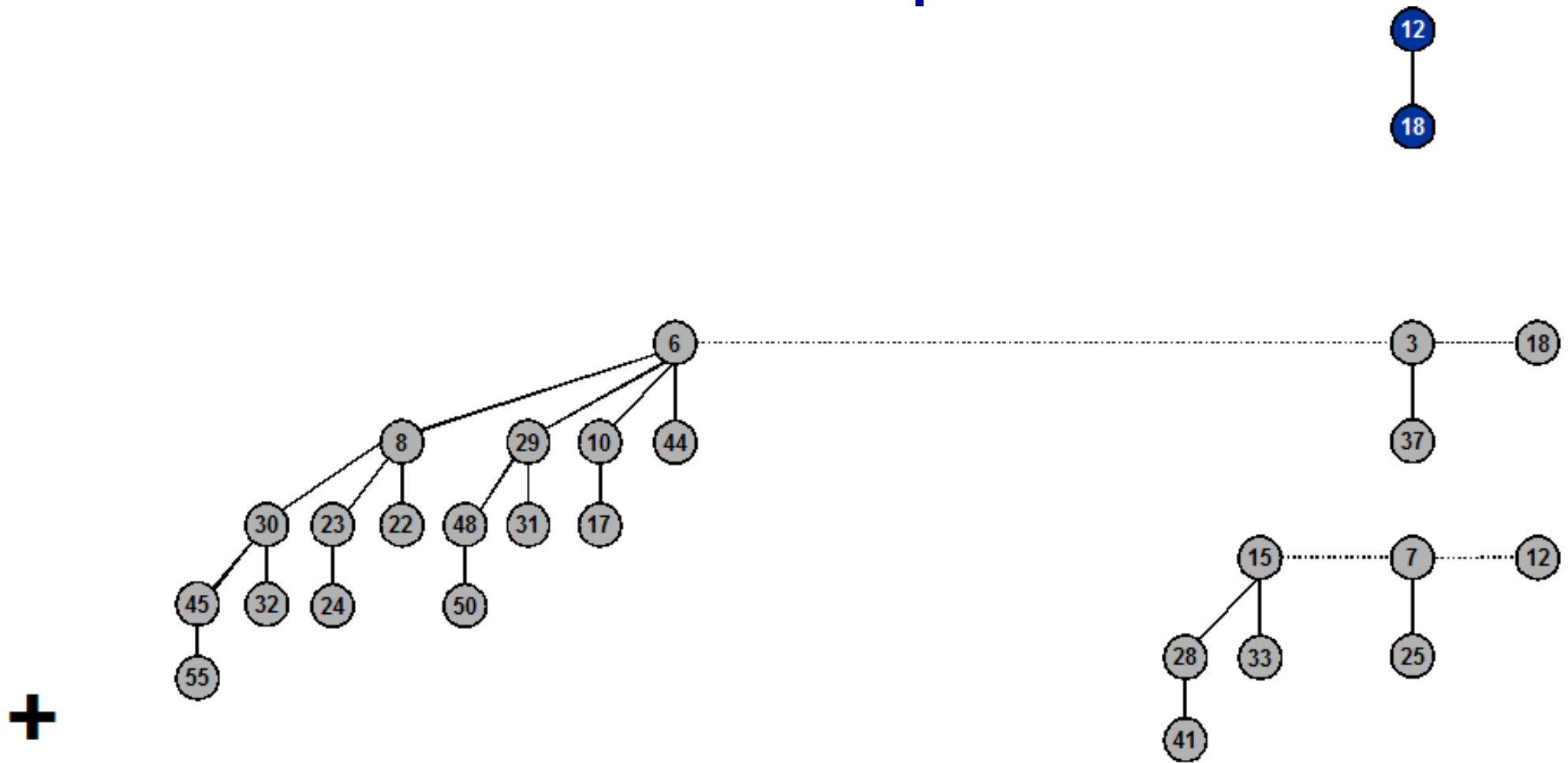
$$19 + 7 = 26$$

		1	1	1	
	1	0	0	1	1
+	0	0	1	1	1
	1	1	0	1	0

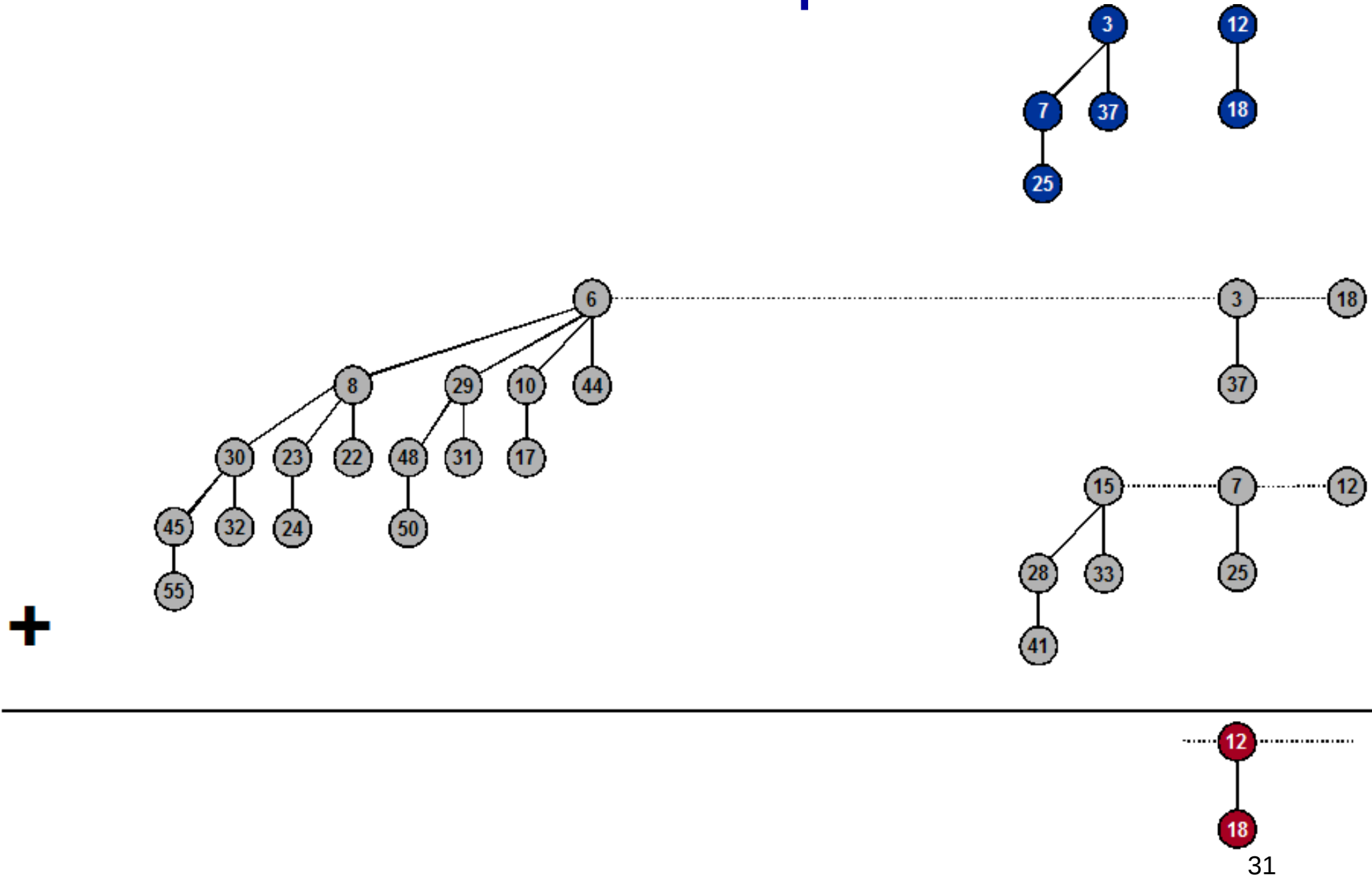
# Binomial Heap: Union



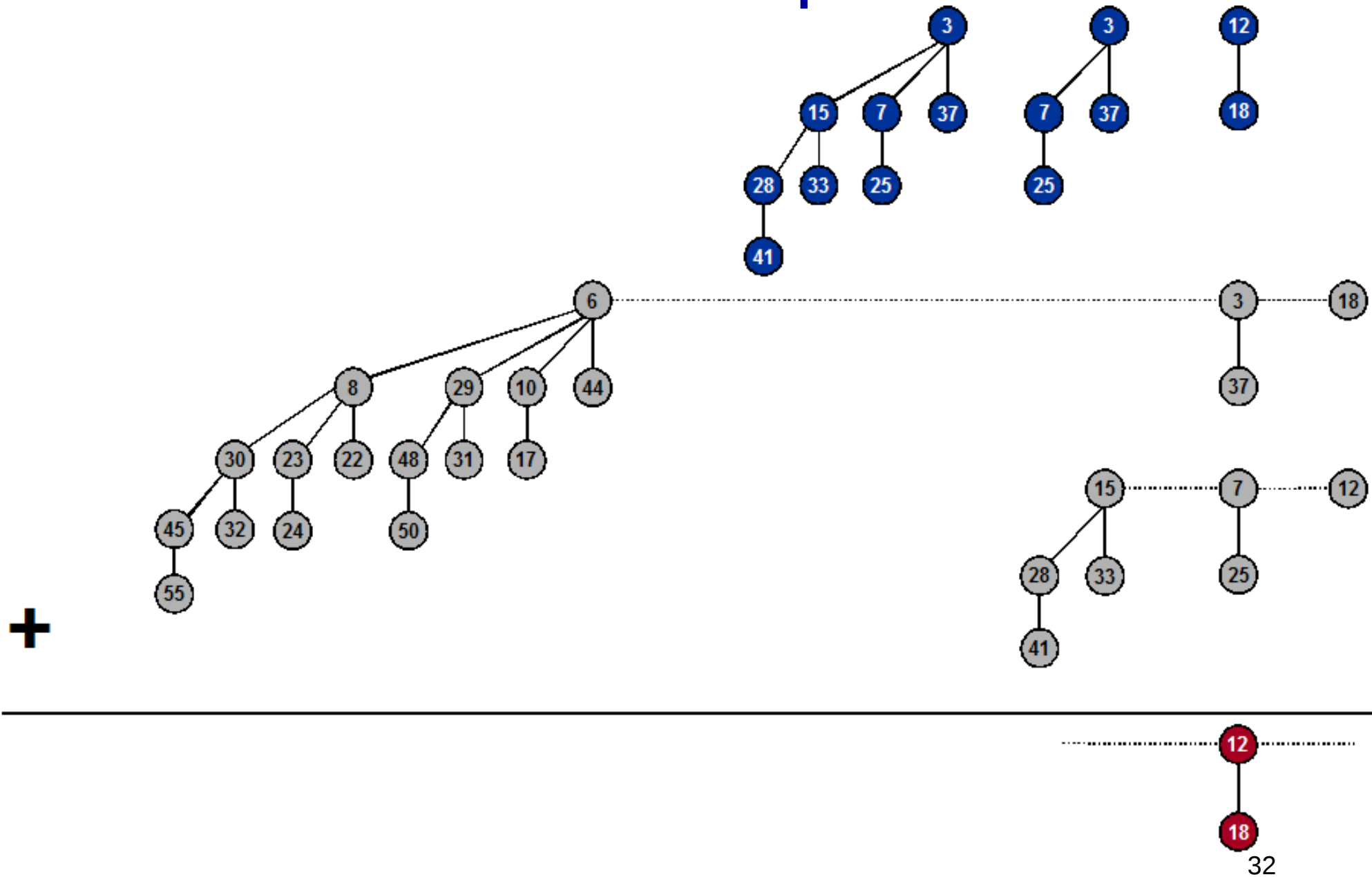
# Binomial Heap: Union



# Binomial Heap: Union

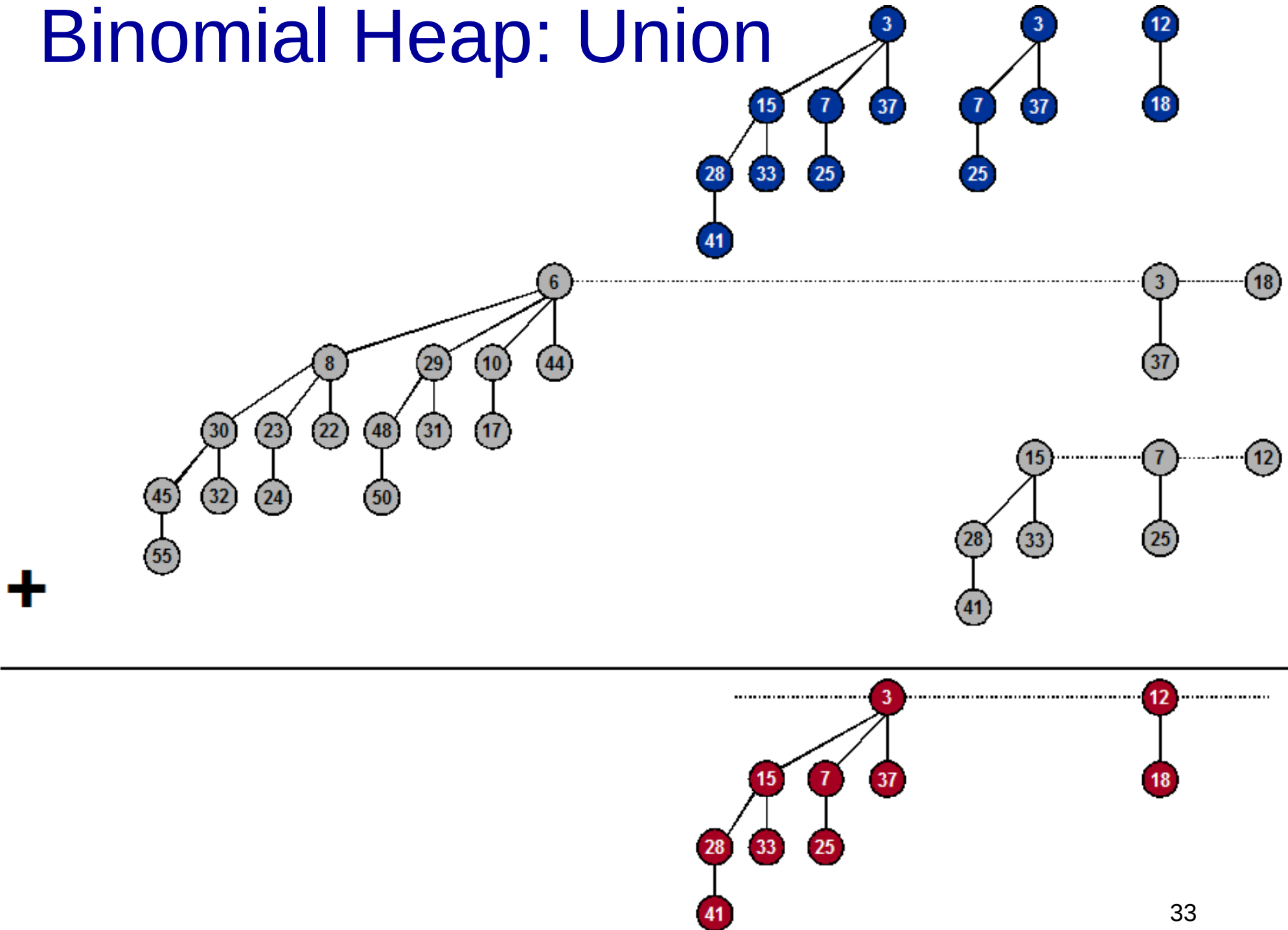


# Binomial Heap: Union



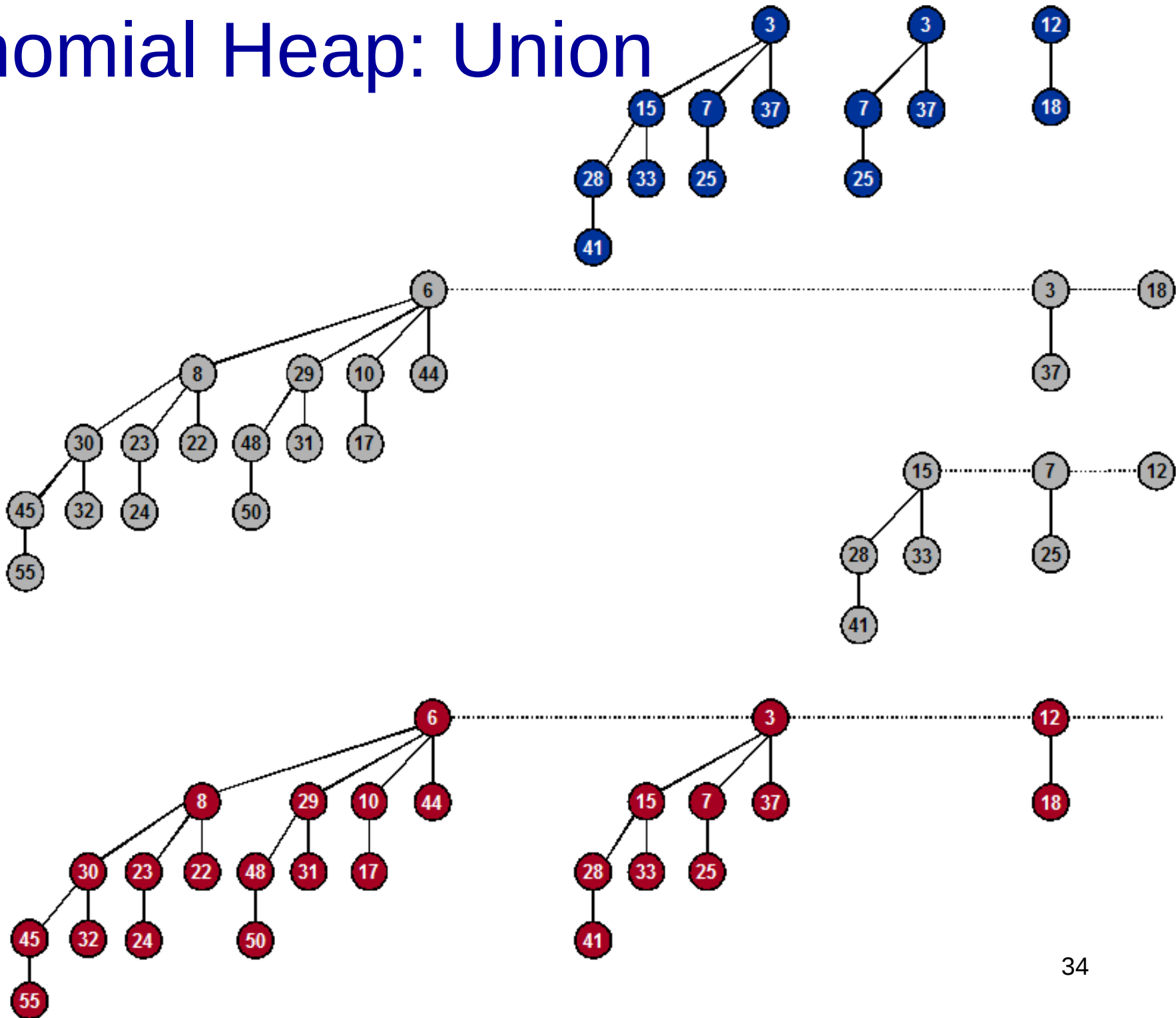


# Binomial Heap: Union



# Binomial Heap: Union

+



# Binomial Heaps: Union

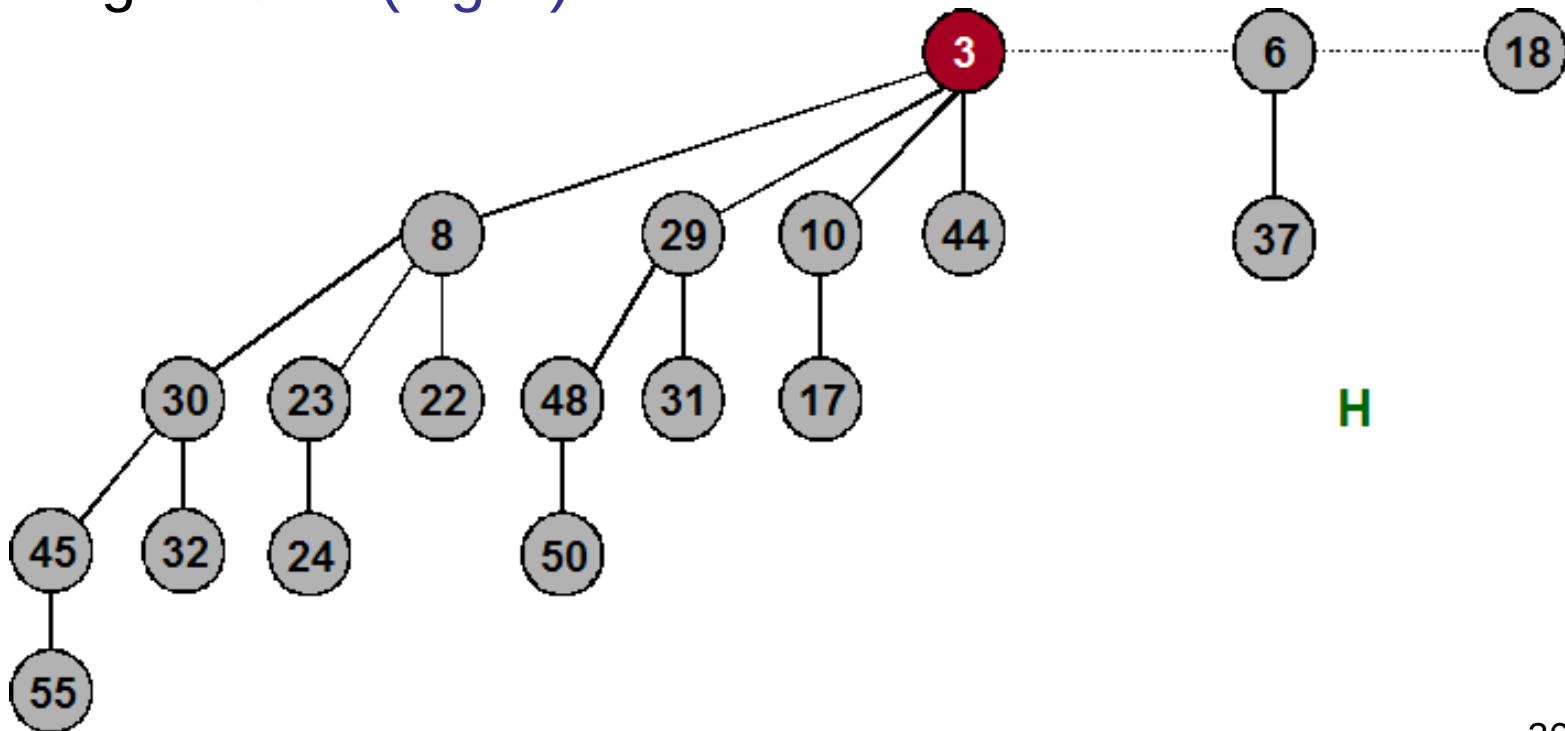
- Create heap H that is union of heaps H' and H''
  - Analogous to binary addition
- Running time:  $O(\log N)$ 
  - Proportional to number of trees in root lists  $\leq 2(\lceil \log_2 N \rceil + 1)$

$$19 + 7 = 26$$

			1	1	1
	1	0	0	1	1
+	0	0	1	1	1
	1	1	0	1	0

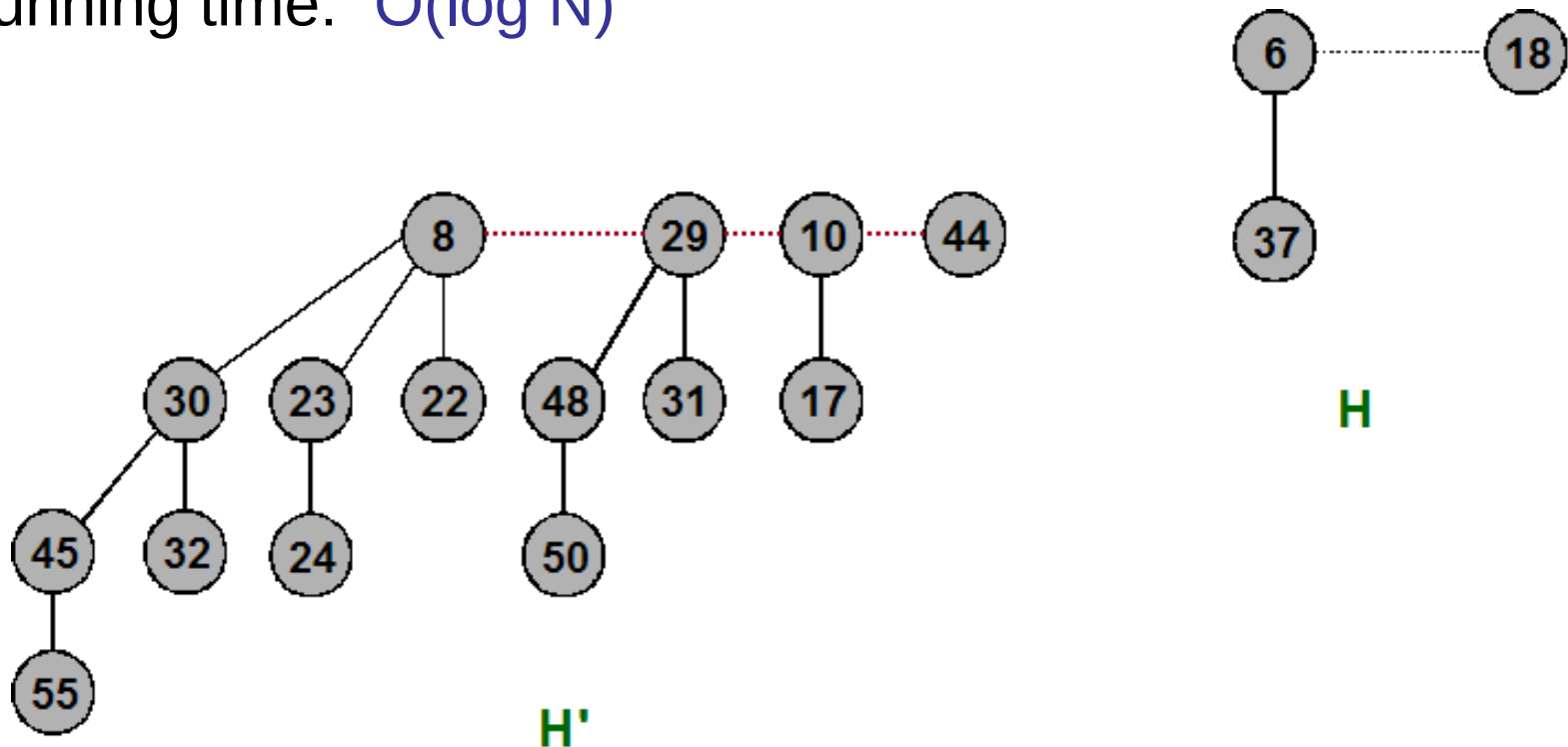
# Binomial Heaps: Delete Min

- Delete node with minimum key in binomial heap  $H$ 
  - Find root  $x$  with min key in root list of  $H$ , and delete
  - $H' \leftarrow$  broken binomial trees
  - $H \leftarrow \text{Union}(H', H)$
- Running time:  $O(\log N)$



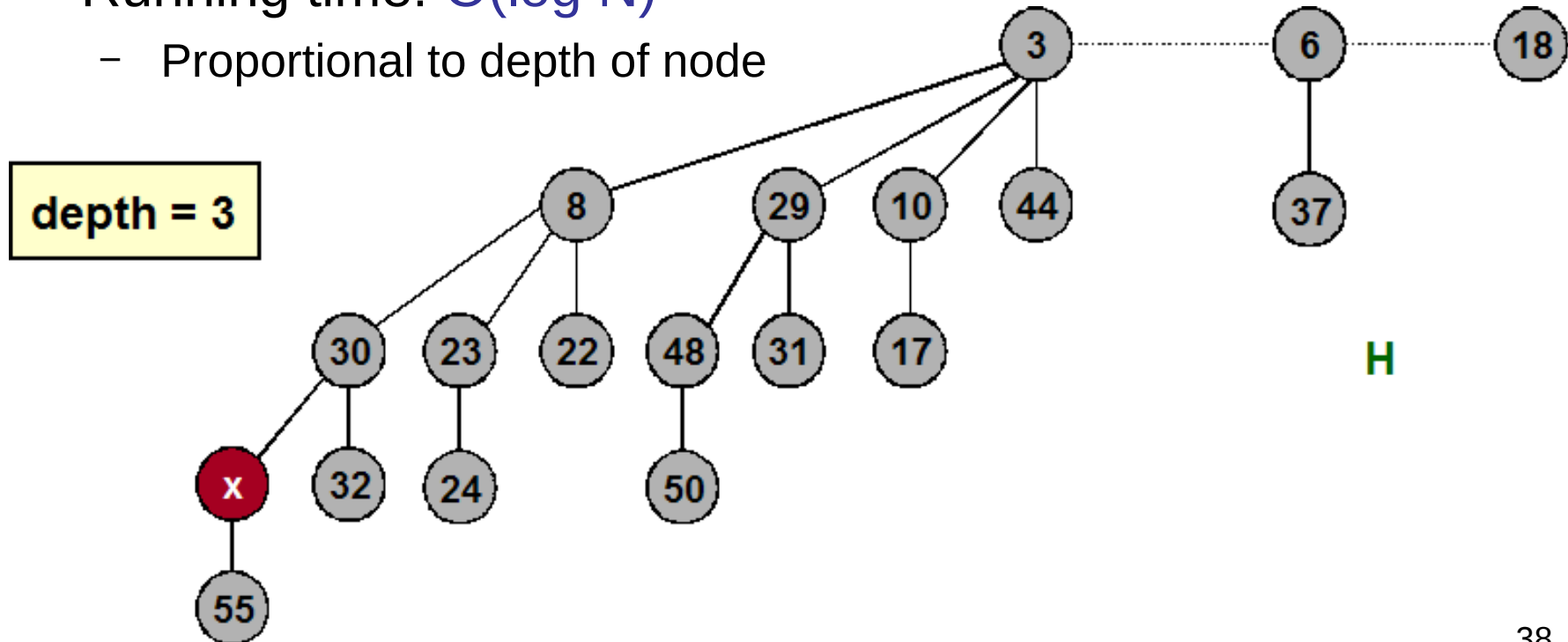
# Binomial Heaps: Delete Min

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  - $H' \leftarrow$  broken binomial trees
  - $H \leftarrow \text{Union}(H', H)$
- Running time:  $O(\log N)$



# Binomial Heaps: Decrease Key

- Decrease key of node  $x$  in binomial heap  $H$ 
  - Suppose  $x$  is in binomial tree  $B_k$
  - Bubble node  $x$  up the tree if  $x$  is too small
- Running time:  $O(\log N)$ 
  - Proportional to depth of node



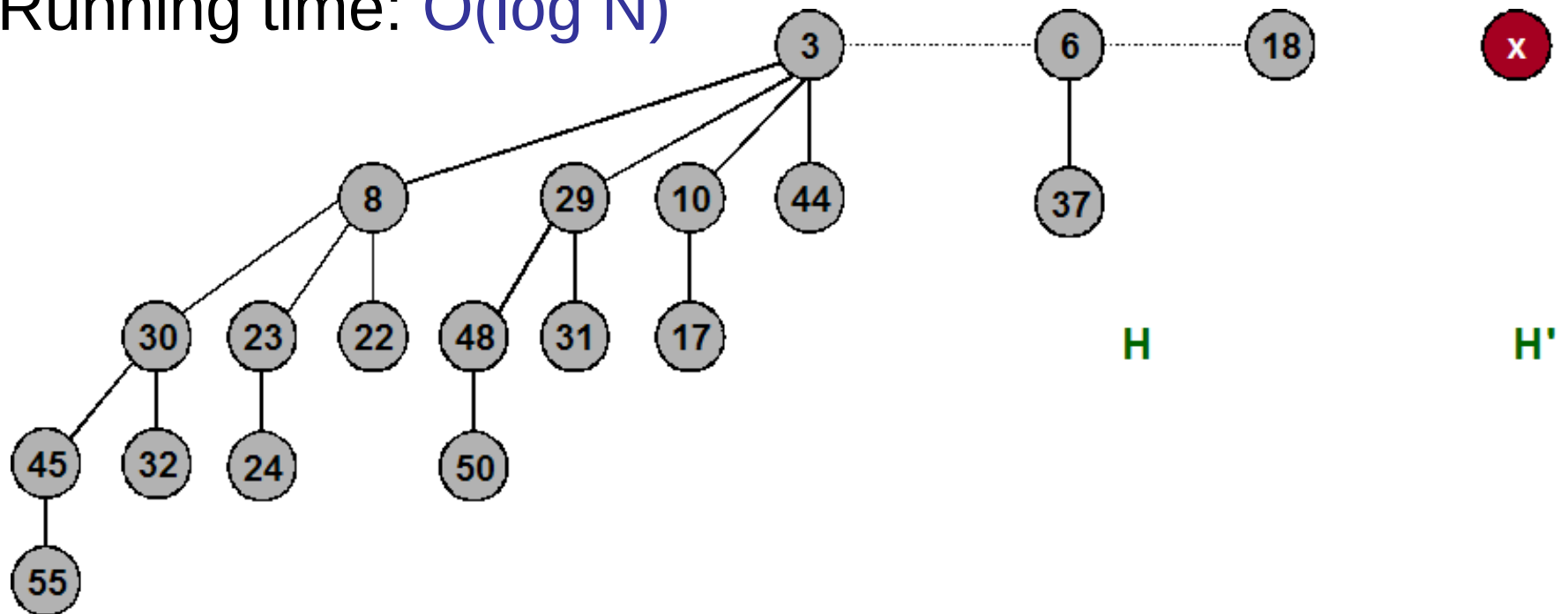
# Binomial Heaps: Delete

- Delete node  $x$  in binomial heap  $H$ .
  - Decrease key of  $x$  to  $-\infty$
  - Delete min
- Running time:  $O(\log N)$

# Binomial Heaps: Insert

- Insert a new node  $x$  into binomial heap  $H$ 
  - $H' \leftarrow \text{MakeHeap}(x)$
  - $H \leftarrow \text{Union}(H', H)$

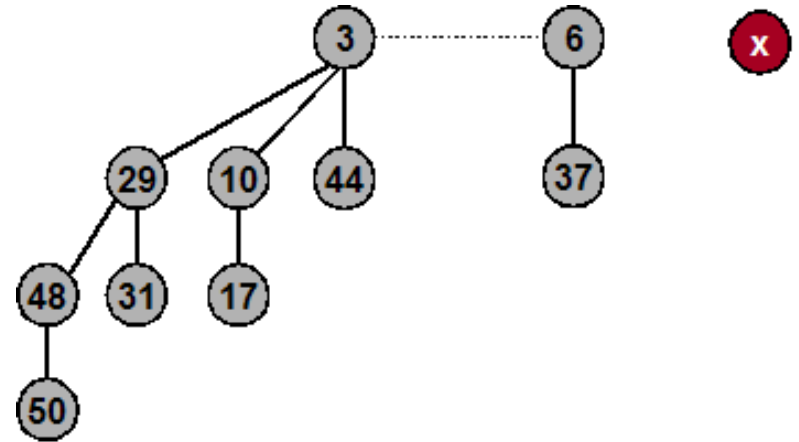
– Running time:  $O(\log N)$





# Binomial Heaps: Sequence of Inserts

- Insert a new node  $x$  into binomial heap  $H$ 
  - If  $N = \dots\dots\dots 0$ , then only 1 steps
  - If  $N = \dots\dots\dots 01$ , then only 2 steps
  - If  $N = \dots\dots\dots 011$ , then only 3 steps
  - If  $N = \dots\dots\dots 0111$ , then only 4 steps



- Inserting 1 item can take  $\Omega(\log_2 N)$  time
  - If  $N = 11\dots 111$ , then  $\log_2 N$  steps
- But, inserting sequence of  $N$  items takes  $O(N)$  time!
  - $(N/2)(1) + (N/4)(2) + (N/8)(3) + \dots \leq 2N$
  - Amortized analysis
  - Basis for getting most operations down to constant time

$$\sum_{i=1}^N \frac{i}{2^i} = 2 - \frac{N}{2^N} - \frac{1}{2^{N-1}}$$

$$\leq 2$$

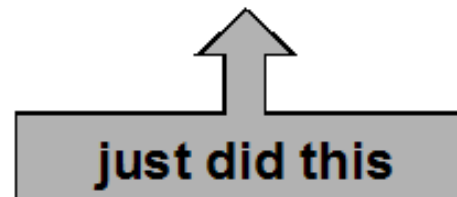
$$\leq N \sum_{i=0}^{\infty} \frac{1}{2^i} = 2N$$

# Binomial Heap Operations

- **MAKE-HEAP()**
  - **INSERT(H,x)**
  - **MINIMUM(H)**
  - **EXTRACT-MIN(H)**
  - **UNION(H1,H2)**
  - **DECREASE-KEY(H,x,k)**
  - **DELETE(H,x)**
- 
- **MAKE-HEAP()** [Trivial, just create an object H, head[H]=nil]
  - **MINIMUM(H)** [Trivial: Return the minimum among binomial tree roots in the binomial heap]

# Priority Queues

		Heaps			
Operation	Linked List	Binary	Binomial	Fibonacci *	Relaxed
make-heap	1	1	1	1	1
insert	1	$\log N$	$\log N$	1	1
find-min	$N$	1	$\log N$	1	1
delete-min	$N$	$\log N$	$\log N$	$\log N$	$\log N$
union	1	$N$	$\log N$	1	1
decrease-key	1	$\log N$	$\log N$	1	1
delete	$N$	$\log N$	$\log N$	$\log N$	$\log N$
is-empty	1	1	1	1	1



# Summary

- Binomial Trees and Binomial Heaps
- Operations on Binomial Heaps
  - Creating New Binomial Heap
  - Finding Minimum Key
  - Uniting Two Binomial Heaps
  - Inserting Node
  - Extracting Node with Minimum Key
  - Deleting Key
  - Decreasing Key