

# EECS 4020

# Algorithms

## HW4

# I. Amortized Analysis

# Q1

## Flipping-Push Stack

- **Push**: insert an item  $\rightarrow \text{cost} = 1$
- **Flip**: when # items = 2 power, all items are flipped upside down  $\rightarrow \text{cost} = \# \text{ items}$

Show that amortized cost of **Push** =  $O(1)$

# Q1 [solution: aggregate method]

- Consider  $m$  **Push** operations
- Total cost for **Push** (except **Flip**) =  $m$
- Total cost for **Flip**  
 $= 2 + 4 + 8 + \dots + K < \dots + m/4 + m/2 + m$   
 $< 2m$  [  $K$  = largest 2 power not exceeding  $m$  ]
- Total cost  $< 3m \rightarrow$  amortized cost =  $O(1)$

# Q1 [solution: accounting method]

- For each **Push**, we pay \$3 to the inserted item
  - \$1 is used immediately
  - \$2 is saved for the next **Flip**
- Whenever **Flip** occurs :
  - Half of the items are inserted since the last **Flip**
  - Each has \$2 → Enough to pay for the current **Flip**

## Q1 [solution: potential method]

- Define a potential function  $\phi$  where

$$\phi(D) = 2 * (\text{\# items inserted since last Flip})$$

- If the current Push does not cause a Flip :

$$\begin{aligned} \text{amortized cost} &= \Delta \phi + \text{actual cost} \\ &= 2 + 1 = 3 \end{aligned}$$

## Q1 [solution: potential method]

- Define a potential function  $\phi$  where

$$\phi(D) = 2 * ( \# \text{ items inserted since last Flip } )$$

- If the current Push causes a Flip :

$$\begin{aligned} \text{amortized cost} &= \Delta \phi + \text{actual cost} \\ &= ( -|D| ) + ( |D| + 1 ) = 1 \end{aligned}$$

# Q2

Show that for Min-Heap :

- **Insert** :  $O(\log n)$  amortized cost
- **Extract-Min** :  $O(1)$  amortized cost

How to do so with potential method?



## Q2 [solution: potential method]

- Define a potential function  $\phi$  where

$$\phi(H) = \sum_v \text{node-depth}(v)$$

- For instance, if the heap  $H$  has 6 nodes,

$$\phi(H) = 1 + 2 + 2 + 3 + 3 + 3$$

## Q2 [solution: potential method]

- For **Insert** :

$$\begin{aligned}\text{amortized cost} &= \Delta \phi & + & \text{actual cost} \\ &= \log |H| & + & \log |H| \\ &= O(\log n)\end{aligned}$$

- For **Extract-Min** :

$$\begin{aligned}\text{amortized cost} &= \Delta \phi & + & \text{actual cost} \\ &= -\log |H| & + & \log |H| \\ &= O(1)\end{aligned}$$

# Q3

- Maintain **n** numbers in sorted arrays
  - Each array has size = 2 power
  - No two arrays have same size
- Only need to support **Insert** (no **Delete**)

How to **Insert** with  $O(\log n)$  amortized cost ?

# Q3 [solution: aggregate method]

From the requirement, we see that :

when we have two arrays with the same size,  
we need to combine them into one

How to do so?

➔ Since arrays are sorted, we can use **merge**

## Q3 [solution: aggregate method]

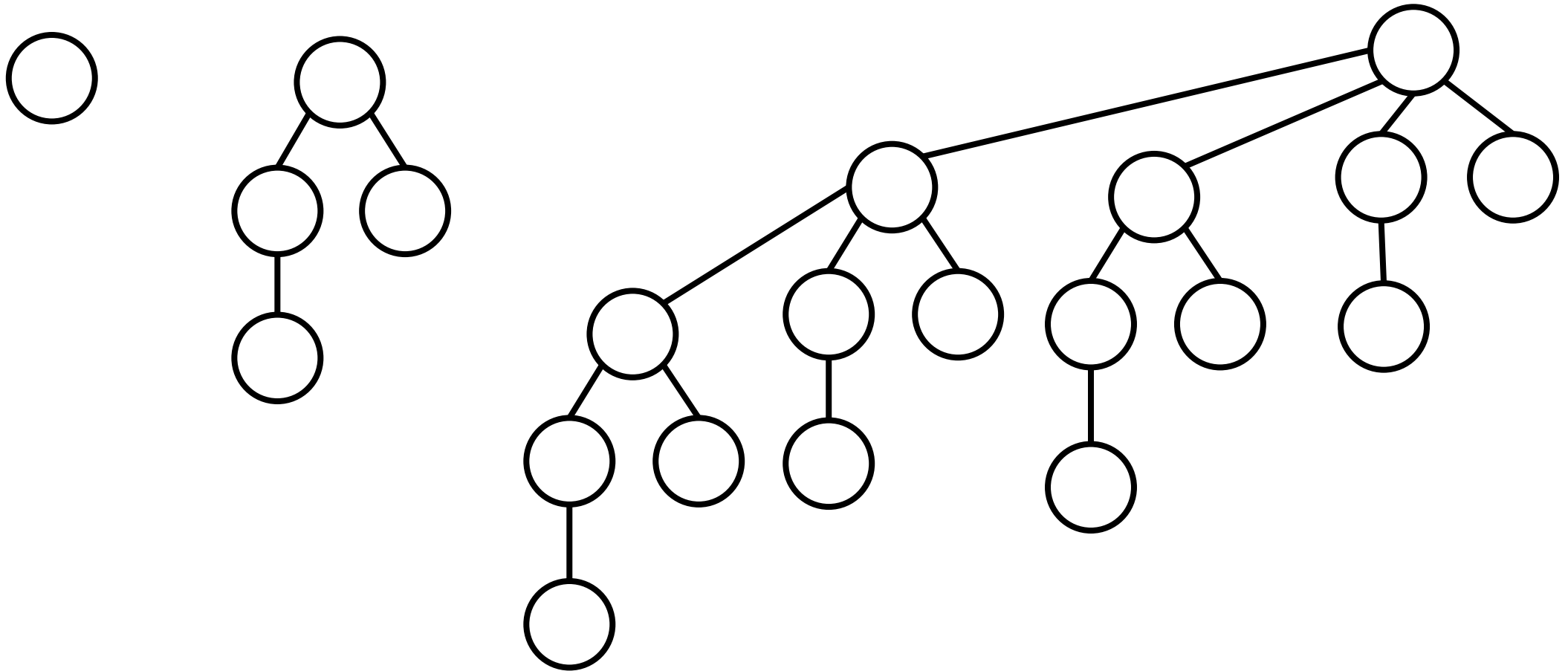
Consider  $n$  Insert operations

- # times to merge two arrays of size  $2^k \leq n / 2^k$
  - cost to merge two arrays of size  $2^k = 2^{k+1}$
- Total cost to merge size  $2^k$  arrays  $\leq 2n$
- Total cost for  $n$  Insert
- $\leq n + 2n \log n \rightarrow$  amortized cost  $= O(\log n)$

## II. Binomial Heap

Q1 [solution]

Draw a binomial heap with 21 nodes



## Q2

Suppose we perform  $n$  **Insert** operations on a Binomial Heap (start from empty)

- Show that total time is  $O(n)$

How to do the analysis ?



## Q2 [solution: potential method]

- Define a potential function  $\phi$  where

$$\phi(H) = \text{number of trees in } H$$

- For instance, if binomial heap  $H$  has 6 nodes,

$$\phi(H) = 2$$

## Q2 [solution: potential method]

Consider an **Insert** operation:

- If no consolidation occurs, then

$$\begin{aligned}\text{amortized cost} &= \Delta \phi + \text{actual cost} \\ &= 1 + 1 \\ &= O(1)\end{aligned}$$

## Q2 [solution: potential method]

Consider an **Insert** operation:

- Else, suppose # trees changes from  $x$  to  $y$ :  
amortized cost       $= \quad \Delta \phi \quad + \quad \text{actual cost}$   
                                  $= \quad (y - x) \quad + \quad (x - y + 1)$   
                                  $= \quad O(1)$

➔ Total cost for  $n$  operations  $= O(n)$

# Q3

Suppose we perform a sequence of  $n$  **Insert** or **Union** on a Binomial Heap (start from empty)

- Can we still show that total time is  $O(n)$  ?

Very tricky [ Much harder than I thought ... ]

## Q3 [solution]

- If we use the textbook definition of Binomial Heap, where after **Union**, we have to perform consolidation :
  - ➔ Previous potential function does not work, as **Union** may take up to  $O(\log n)$  time, and without changing # trees

## Q3

- Yet, it does not mean that we cannot bound the total time to be  $O(n)$
- We can separate the costs into two parts, and use different ways to bound :
  - Insert
  - Union

## Q3 [solution]

- For **Insert**, we use the same potential method, so that total cost of this is  $O(n)$
- For **Union** a heap of size  $x$  with a heap of size  $y$  :  
cost =  $\log x + \log y$   
 $\leq$  cost to do  $y$  increment to  
a binary counter with value  $x$

## Q3 [solution]

- Thus, for **Union**,

total cost  $\leq$  cost to do **n** increment to  
a binary counter with value **0**

➔ Total cost for either **Insert** or **Union** is  $O(n)$

➔ Done!



## Q3 [solution]

- Indeed, we may redefine a Binomial Heap, where after **Union**, we do not perform consolidation (just like Fibonacci Heap)
- Do consolidation during **Extract-Min**

## Q3 [solution]

- This idea is called **Lazy Union**
  - **Extract-Min** :  $O(\log n)$  amortized cost
  - Others :  $O(1)$  amortized cost
- In this case, we can use the same potential function to bound both **Insert** and **Union**

# III. Fibonacci Heap

## Q1 [solution]

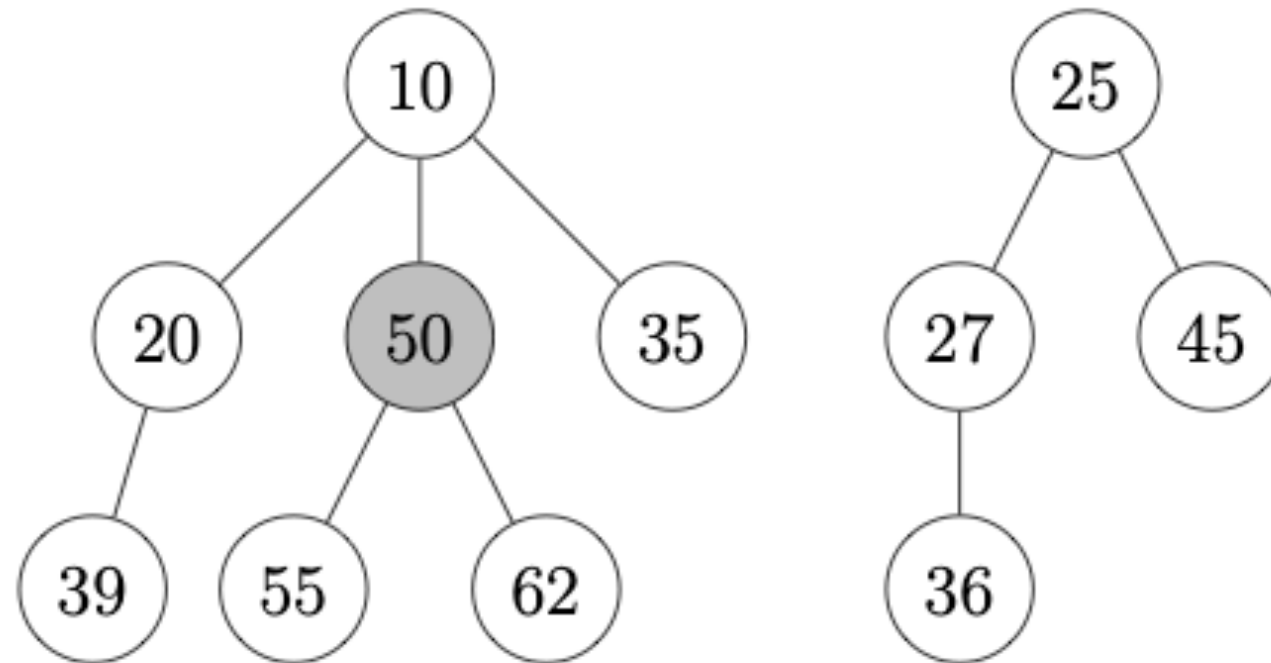
How can a root in a Fibonacci Heap be marked ?

Ans : When a marked node's parent = MIN, and is removed during **Extract-Min**

Ex : Insert 1, Insert 2, Insert 3, Insert 4,  
Delete 4, Extract-Min

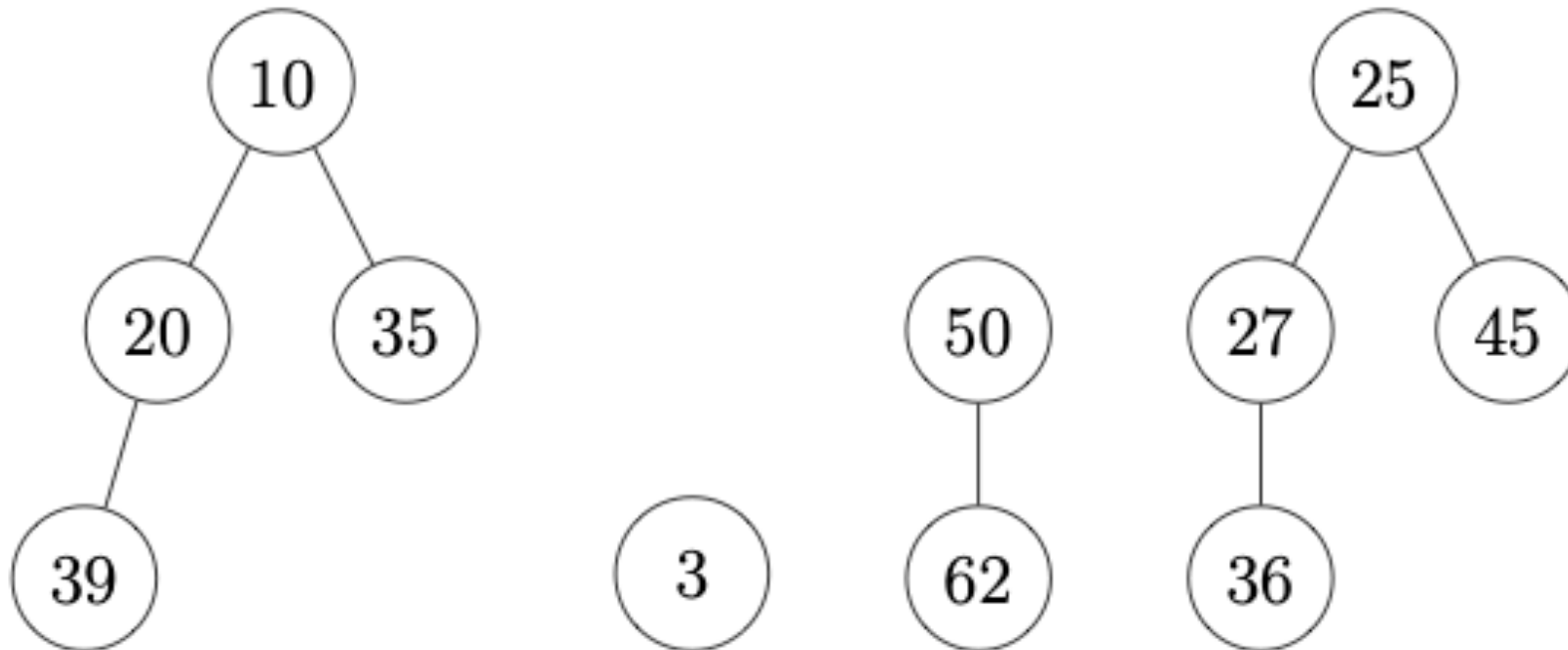
Q2

Consider the following Fibonacci Heap :



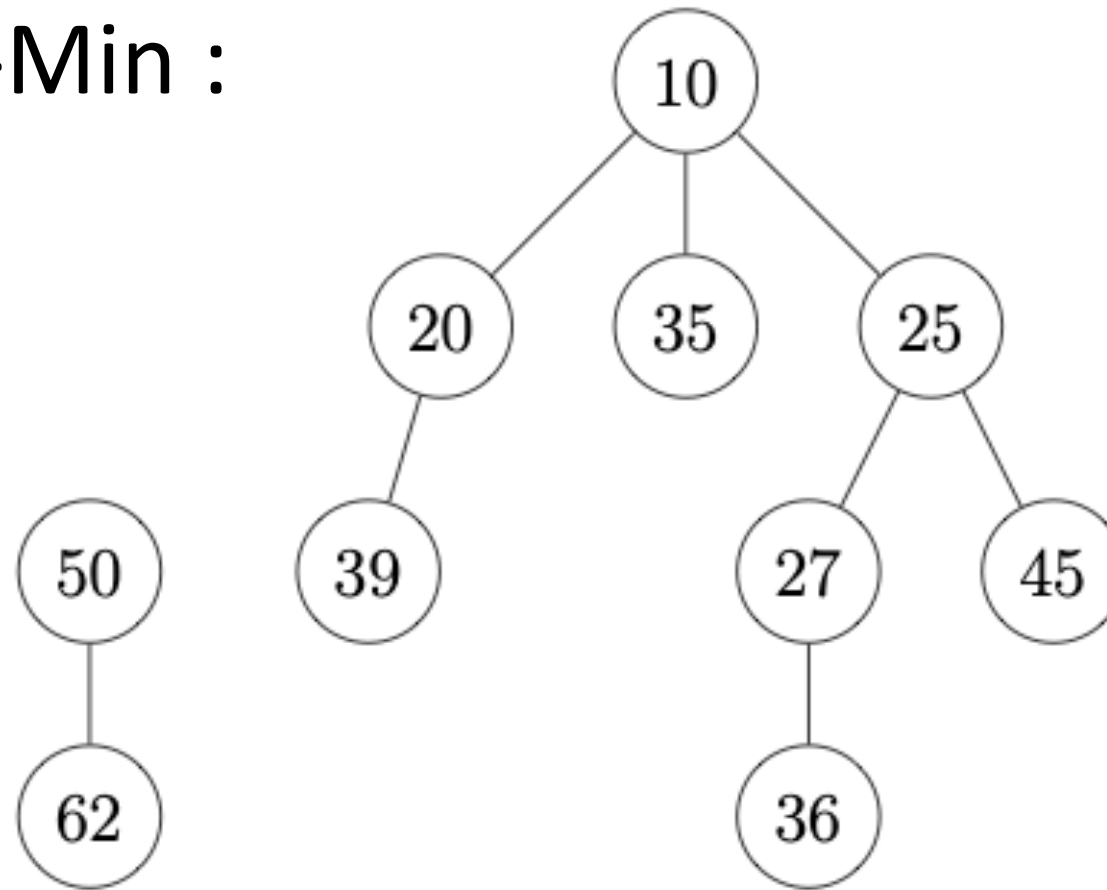
## Q2(a) [solution]

After Decrease-Key 55 to 3 :



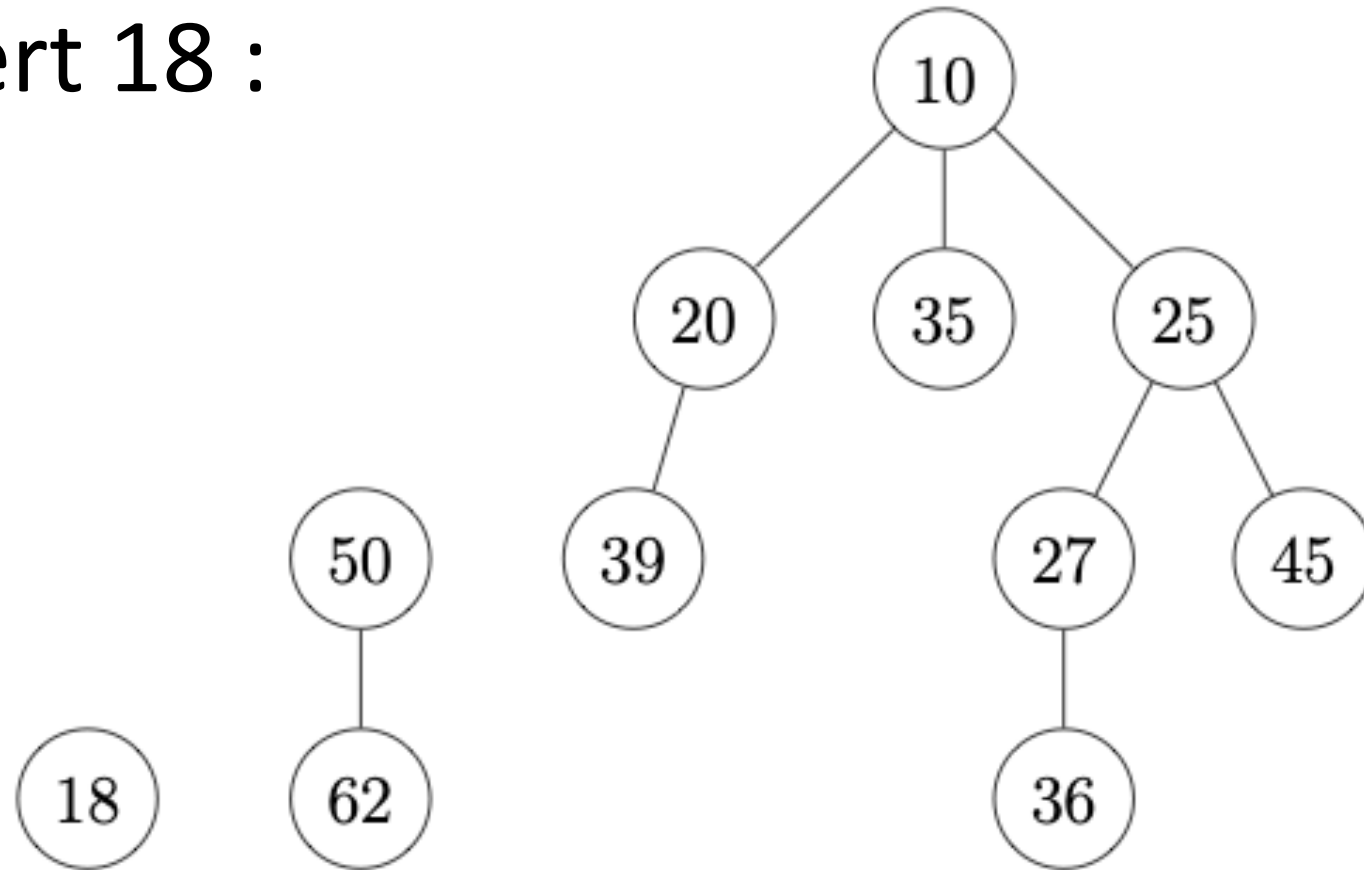
Q2(b) [solution]

Then, Extract-Min :



Q2(c) [solution]

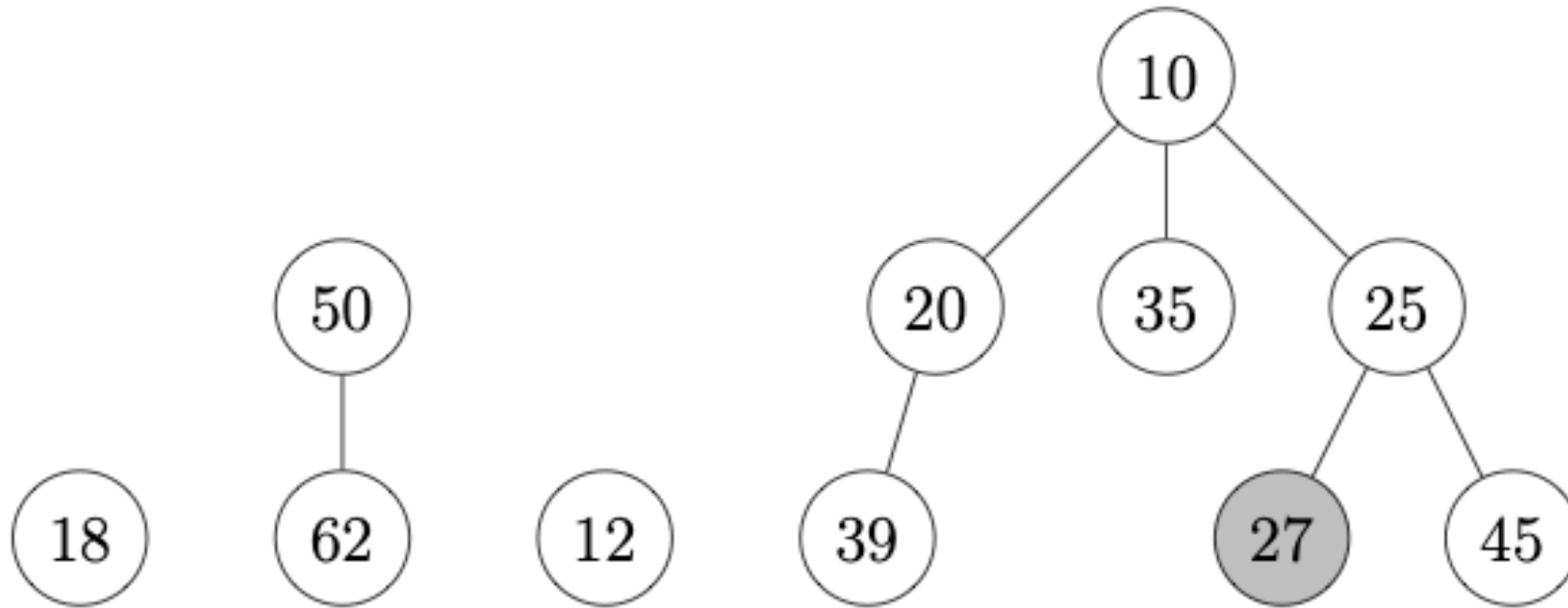
Then, Insert 18 :





Q2(d) [solution]

Then, Decrease-Key 36 to 12 :



Q2(e) [solution (not unique) ]

Then, Extract-Min :

