

# Exercise 1

## 1. Representation Invariant & Abstraction Function

Representation : Heap = { A: array, size: int }

Representation Invariant :

$$\text{RI} = 0 \leq \text{size} \leq \text{A.length} \ \&\& \ \forall 1 < i \leq \text{A.length}, \text{A}[\lfloor i/2 \rfloor] \leq \text{A}[i]$$

Abstraction Function :

$$\text{Abs}(R) = \text{Abs}(R, 1), \text{ where}$$

$$\text{Abs}(R, i) = \begin{cases} \langle R.A[i], \text{Abs}(R, 2 * i), \text{Abs}(R, 2 * i + 1) \rangle, & \text{if } i \leq R.size \\ \text{Nil}, & \text{if } i > R.size \end{cases}$$

## 2. Check the Representation Invariant

[code in the wet part : MinHeapRep]

## 3. MIN-HEAPIFY

```
• MIN-HEAPIFY(A:T[], size:int, i:int):  
  curr = i  
  smallest = curr  
  do :  
    curr = smallest  
    leftChild = 2 * curr + 1  
    rightChild = 2 * curr + 2  
  
    if leftChild < size and A[leftChild] < A[smallest]:  
      smallest = leftChild  
    if rightChild < size and A[rightChild] < A[smallest]:  
      smallest = rightChild  
  
    if smallest != curr:  
      swap(A[curr], A[smallest])  
  while(smallest != curr)
```

## 4. MIN-HEAPIFY Complexity Analysis

Our algorithm compares  $A[i]$  with its two children, swap if they don't satisfy the Min-Heap RI and then continue the loop with the child index. So the worst case will be: The MIN-HEAPIFY starts with the root, ends at one leaf, visiting all **height** =  $\lfloor \log_2 n \rfloor$  levels. In each loop, the three conditional check and one possible swapping all run in  $O(1)$ . So the worst-case time complexity of MIN-HEAPIFY is  $\log_2 n \cdot O(1) = O(\log_2 n)$ .

## 5. Correctness Proof

- Contract of MIN-HEAPIFY :
  - PC :  $|A| = \text{size} \ \&\& \ 0 \leq i < \text{size}$ 
    - && the subtree rooted at left child of  $A[i]$  is a valid Min-Heap
    - && the subtree rooted at right child of  $A[i]$  is a valid Min-Heap

- **Pc'** :  $|A| = \text{size} \ \&\& \ 0 \leq i < \text{size}$ 
  - &&** the subtree rooted at left child of  $A[i]$  is a valid Min-Heap
  - &&** the subtree rooted at right child of  $A[i]$  is a valid Min-Heap
  - &&**  $\text{curr} = i$
- **Inv** :  $i \leq \text{curr} < \text{size}$ 
  - &&** the subtree rooted at left child of  $A[i]$  is a valid Min-Heap
  - &&** the subtree rooted at right child of  $A[i]$  is a valid Min-Heap
- **Qc'** :  $A[\text{curr}] < A[\text{leftChild}]$ , if it exists **&&**  $A[\text{curr}] < A[\text{rightChild}]$ , if exist
- **QC** : the tree rooted at index  $i$  is a valid Min-Heap

• Using the Loop Invariant Theorem :

- **Initialization:** Assume **Pc** holds, we need to prove **Inv** hold:  
Before the loop starts, from **Pc'**, we know that  $\text{curr} = i$ ,  
then  $i \leq \text{curr} < \text{size}$ , the loop invariant holds at the start.
- **Maintenance:** Assume **Inv&&B** holds, we need to prove the loop make **Inv** true again :

**Inv&&B** :  $i \leq \text{curr} < \text{size} \ \&\& \ \text{smallest} \neq \text{curr}$

**&&** the subtree rooted at left child of  $A[i]$  is a valid Min-Heap

**&&** the subtree rooted at right child of  $A[i]$  is a valid Min-Heap

Inside each loop, we compare  $A[\text{curr}]$  to its two children. If they satisfy the Min-Heap property, then break the loop and **smallest == curr**. Otherwise, swap  $A[\text{curr}]$  with the smaller child, and continue the loop at **curr = smallest**. So, in any case, whether the value of **curr** be updated or not, **curr** is always smaller than **size** (Because if  $2 * \text{curr} + 1$  or  $2 * \text{curr} + 2$  exceed **size**, then they have no chance to be **smallest**).  $\Rightarrow$  After the loop,  $i \leq \text{curr} < \text{size}$ . And the swap on the level of  $A[\text{curr}]$  does not influence the subtrees, which are already valid Min-Heaps. Thus, **Inv** still holds after each loop.

- **Termination:** Once the loop ends, **Inv&&(not)B** holds, we need to prove **QC** holds :

**Inv&&(not)B** :  $i \leq \text{curr} < \text{size} \ \&\& \ \text{smallest} == \text{curr}$

**&&** the subtree rooted at left child of  $A[i]$  is a valid Min-Heap

**&&** the subtree rooted at right child of  $A[i]$  is a valid Min-Heap

That means no swapping happens in the last loop, the Min-Heap property is eventually satisfied at the last **curr** position. **Inv&&(not)B** tells the two subtrees are initially valid Min-Heaps, then after we fix the possible violation, the tree rooted at index  $i$  is a valid Min-Heap now. Therefore, **QC** holds.

Thus, by the **Loop Invariant Theorem**, we've shown our algorithm **MIN-HEAPIFY** is correct.

## Exercise 2

### 1. Representation invariant

Representation :  $\text{Heap} = \{ \text{root: Node} \}$

$\leftarrow \text{Node} = \{ \text{value: T, parent: Node, left: Node, right: Node} \}$

Representation invariant :

**RI** = root is a binary tree && for  $\forall \text{ node} \in \text{Heap}$ ,

if node.left exists, then  $\text{node.value.compareTo}(\text{node.left.value}) \leq 0$

if node.right exists, then  $\text{node.value.compareTo}(\text{node.right.value}) \leq 0$

[code in the wet part : `MinHeapTreeRep`]

### 2. Insertion in Min-Heap

- the pseudo-code definition of `insertion` :

```
Node<T> insertion(Node<T> node, T value) :
    Node<T> newNode = new Node<>(value)
    if (node == null) :
        return newNode
    Node<T> parent = parentOfNew(node)
    if (parent.left == null) :
        parent.left = newNode
    else :
        parent.right = newNode
    newNode.parent = parent
    MIN-HEAPIFY(newNode)
    return node
```

- the pseudo-code definition of auxiliary operations :

```
Node<T> parentOfNew(Node<T> node):
    if (node == null) :
        return null
    if (node.left == null || node.right == null) :
        return node
    if (parentOfNew(node.left) != null) :
        return parentOfNew(node.left)
    return parentOfNew(node.right)
```

```
void MIN-HEAPIFY(Node<T> node) :
    while (node.parent != null) :
        if (node.value.compareTo(node.parent.value) >= 0) :
            break
        else :
            swap(node.value, node.parent.value)
            node = node.parent
```

#### 4. Complexity of Insertion

- Inside the `insertion` algorithm, we :
  - Set up a Node  $\Rightarrow O(1)$
  - Check the condition `node == null`, and possible return  $\Rightarrow O(1)$
  - Set up a Node, given by `parentofNew`, which runs recursively till one leaf is reached. In the worst case, it visits all the nodes in the tree  $\Rightarrow O(n)$
  - Figure out which child of parent is null, and link the new node we create into the right place  $\Rightarrow O(1)$
  - Heapify the new tree, where new node is taken as a leaf. In the worst case, the new node compares and swaps from bottom to the top, visiting all levels  $\Rightarrow O(\log_2 n)$

The time complexity of `insertion` is  $O(1) + O(n) + O(\log_2 n) = O(n)$

#### 5. Implementation for Insertion

[code in the wet part : `MinHeapInsert`]