

HEAP

Tian Zhang
2018/09/09

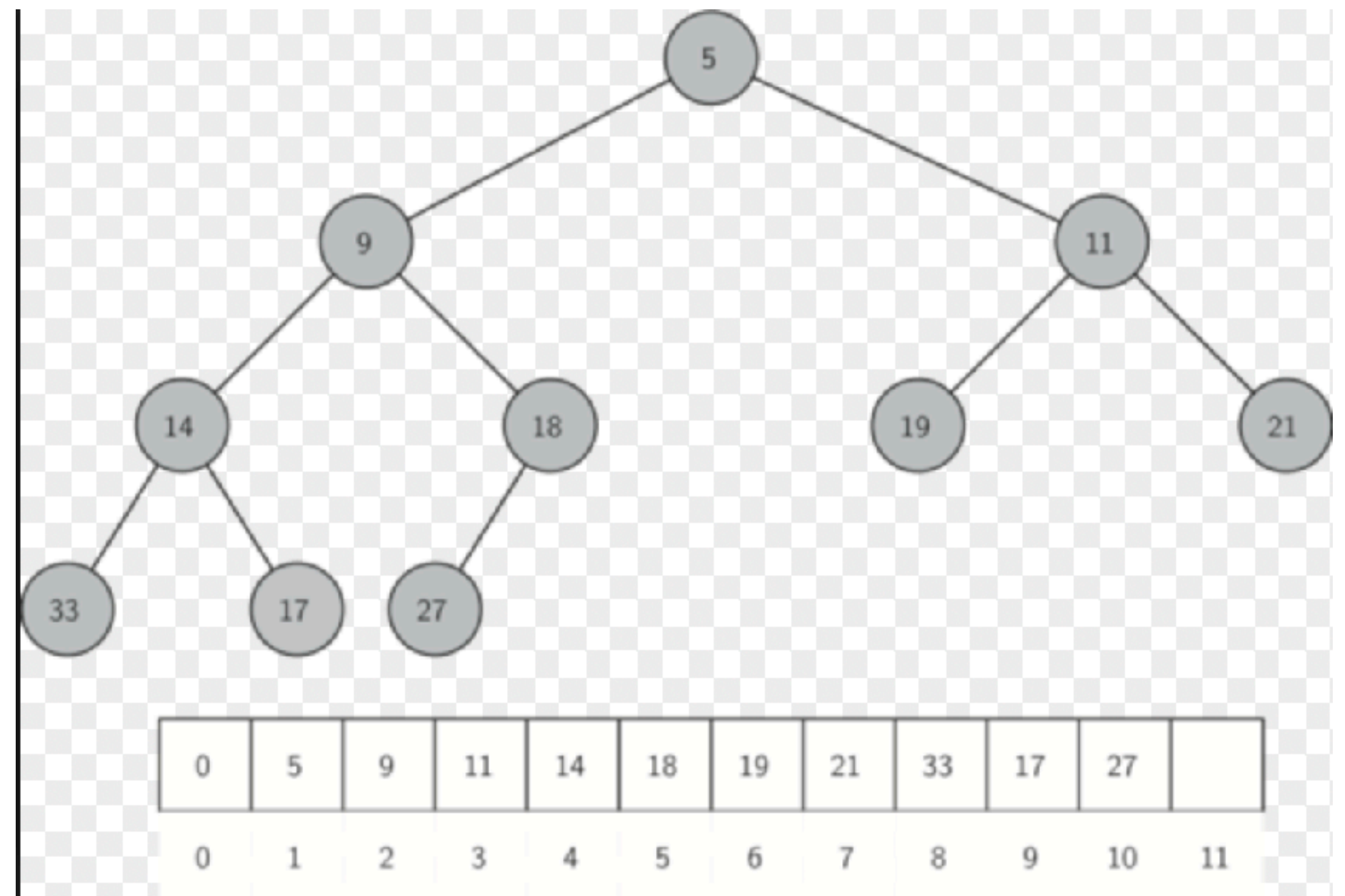
OVERVIEW

- Introduction
- Implementation
- Application

INTRODUCTION

- Heap is a specialized tree-based data structure that satisfies the heap property
- The **min**-heap property: the value of each node is greater than or equal to the value of its parent, with the minimum-value element at the root.
- The **max**-heap property: the value of each node is less than or equal to the value of its parent, with the maximum-value element at the root.
- Heap sometimes refer as priority queue, since PQ is very easy to implement from heap and they have similar characteristics, i.e. when you enqueue an item on a priority queue, the new item may move all the way to the front.

Complete Binary Tree



IMPLEMENTATION

- A common implementation is the binary heap
- ***Array*** based heap outperforms ***Linked-list*** based heap
 - I. Easy to compute -> if parent location is p , then children location is $2p$ and $2p+1$
 - II. Lower memory usage -> no pointer needed
 - III. Easier memory management -> only one object allocated rather than N

IMPLEMENTATION

- **BinaryHeap():** creates a new, empty, binary heap.
- **size():** returns the number of items in the heap.
- **insert(k):** adds a new item to the heap.
- **findMin():** returns the item with the minimum key value, leaving item in the heap.
- **delMin():** returns the item with the minimum key value, removing the item from the heap.
- **buildHeap(list):** builds a new heap from a list of keys.

IMPLEMENTATION - insert(k)

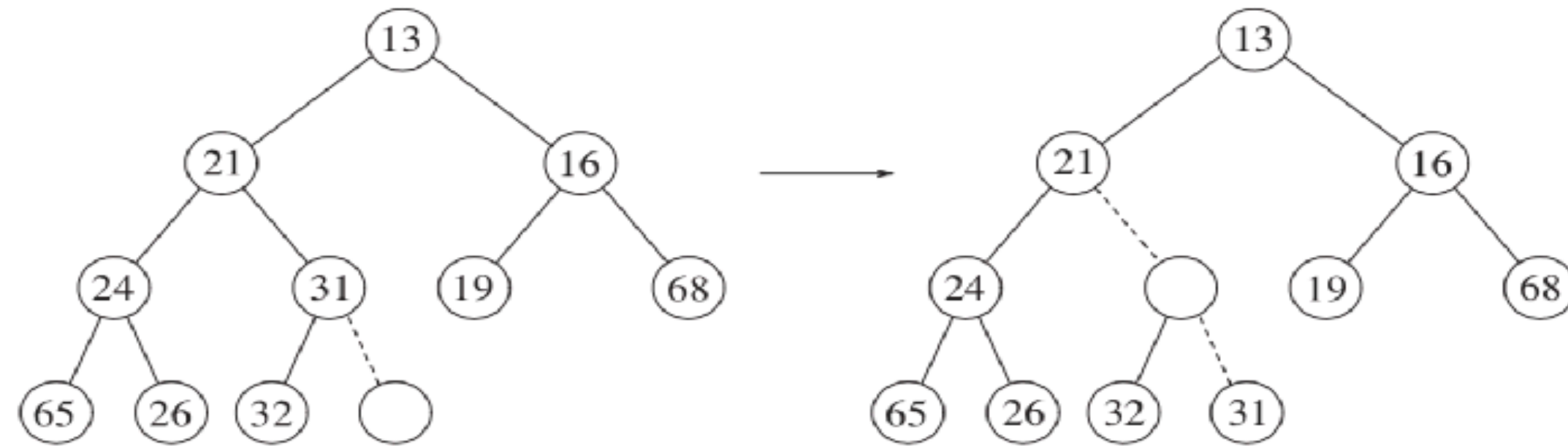


Figure 6.6 Attempt to insert 14: creating the hole, and bubbling the hole up

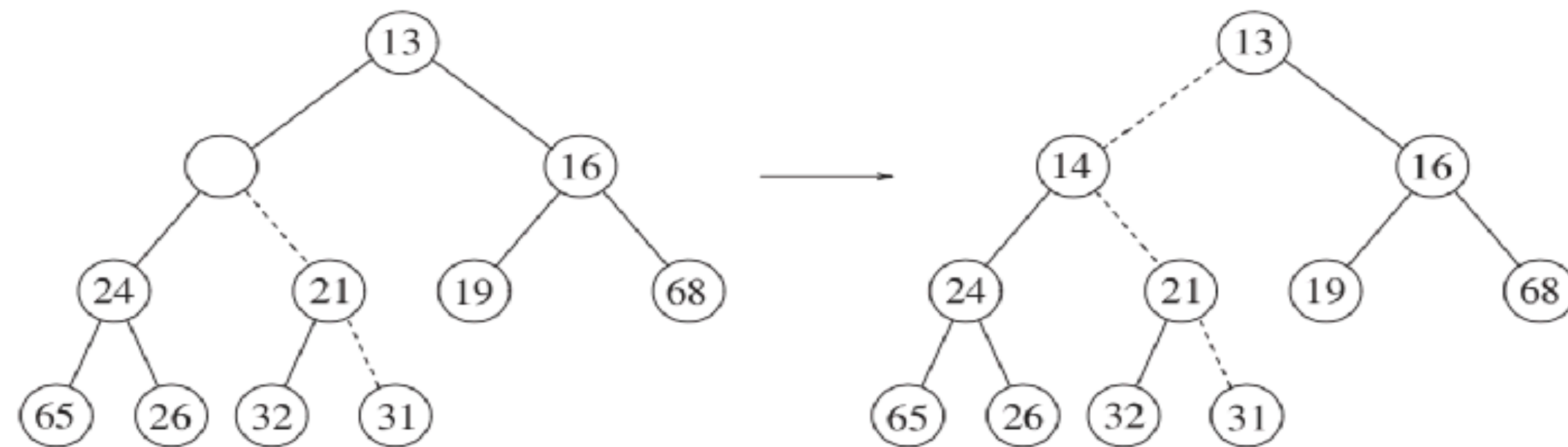


Figure 6.7 The remaining two steps to insert 14 in previous heap

Complexity: the maximum height of tree is $\log(n)$, so when Insert an element, we need to percolate up by doing maximum $\log(n)$ swap operations, thus $O(\log(n))$

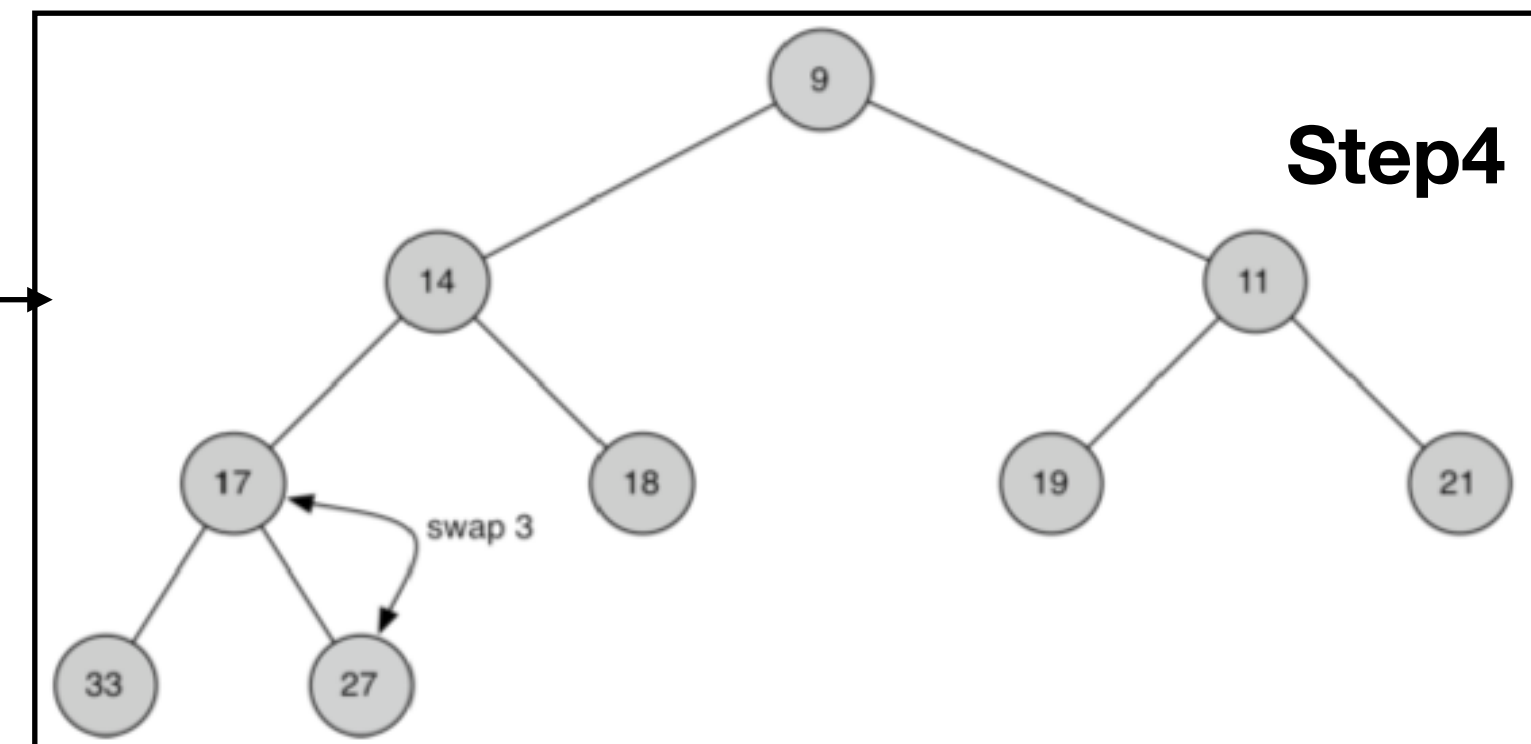
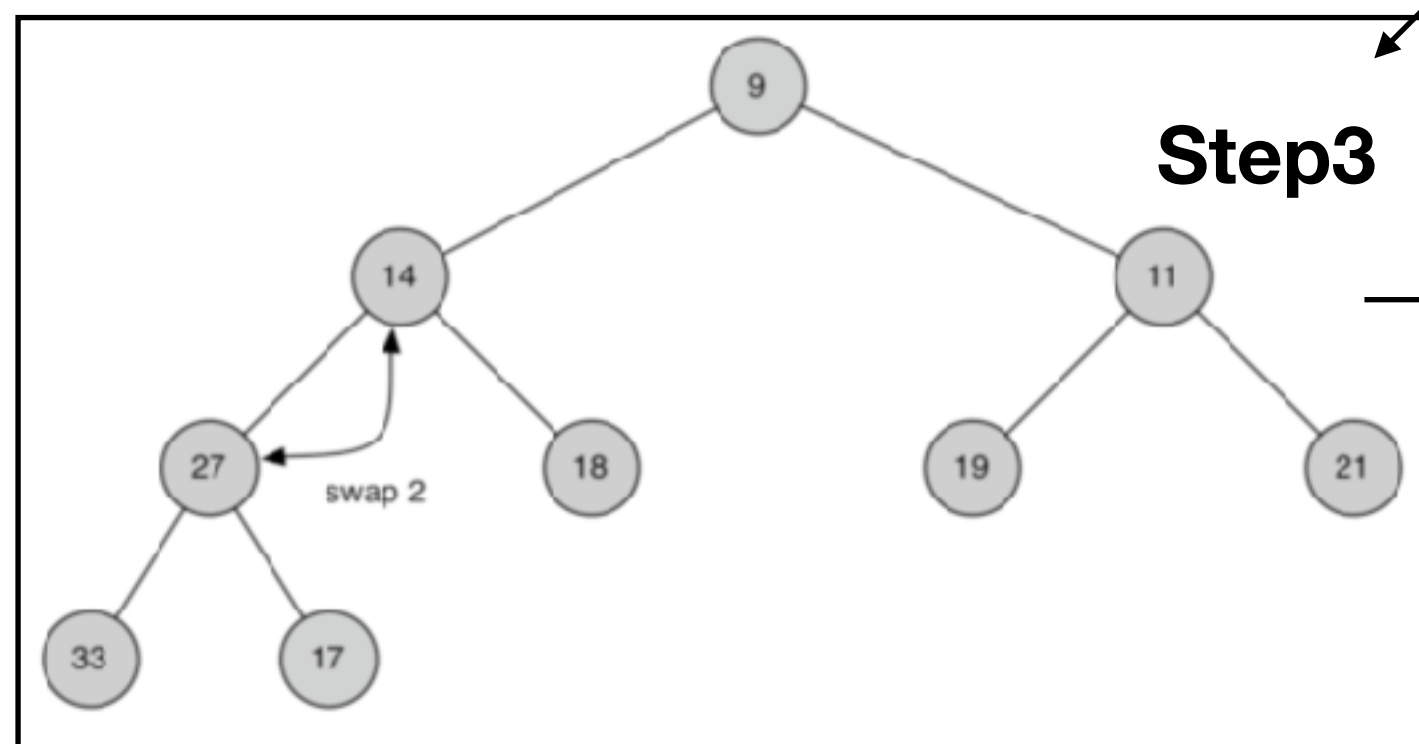
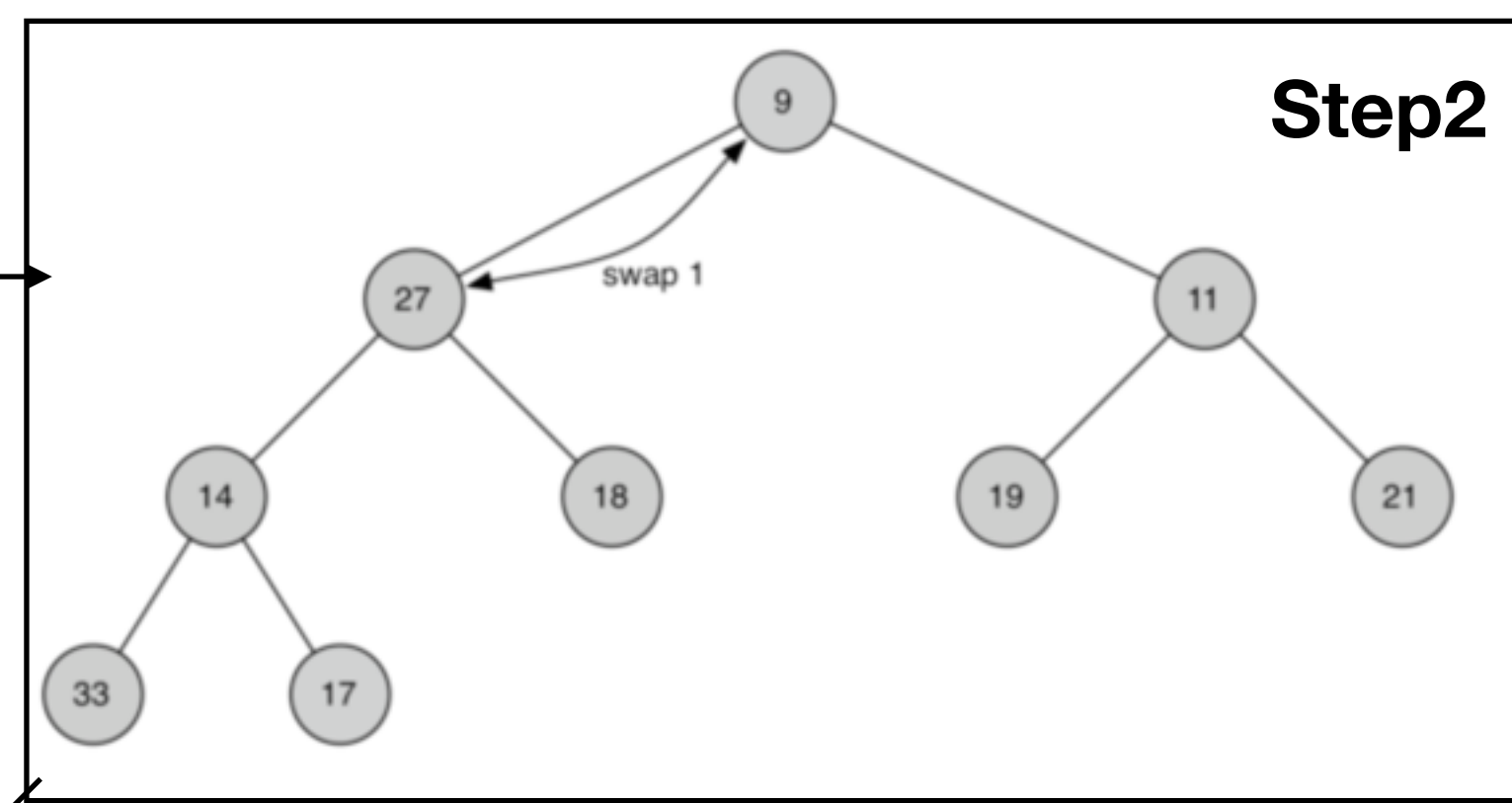
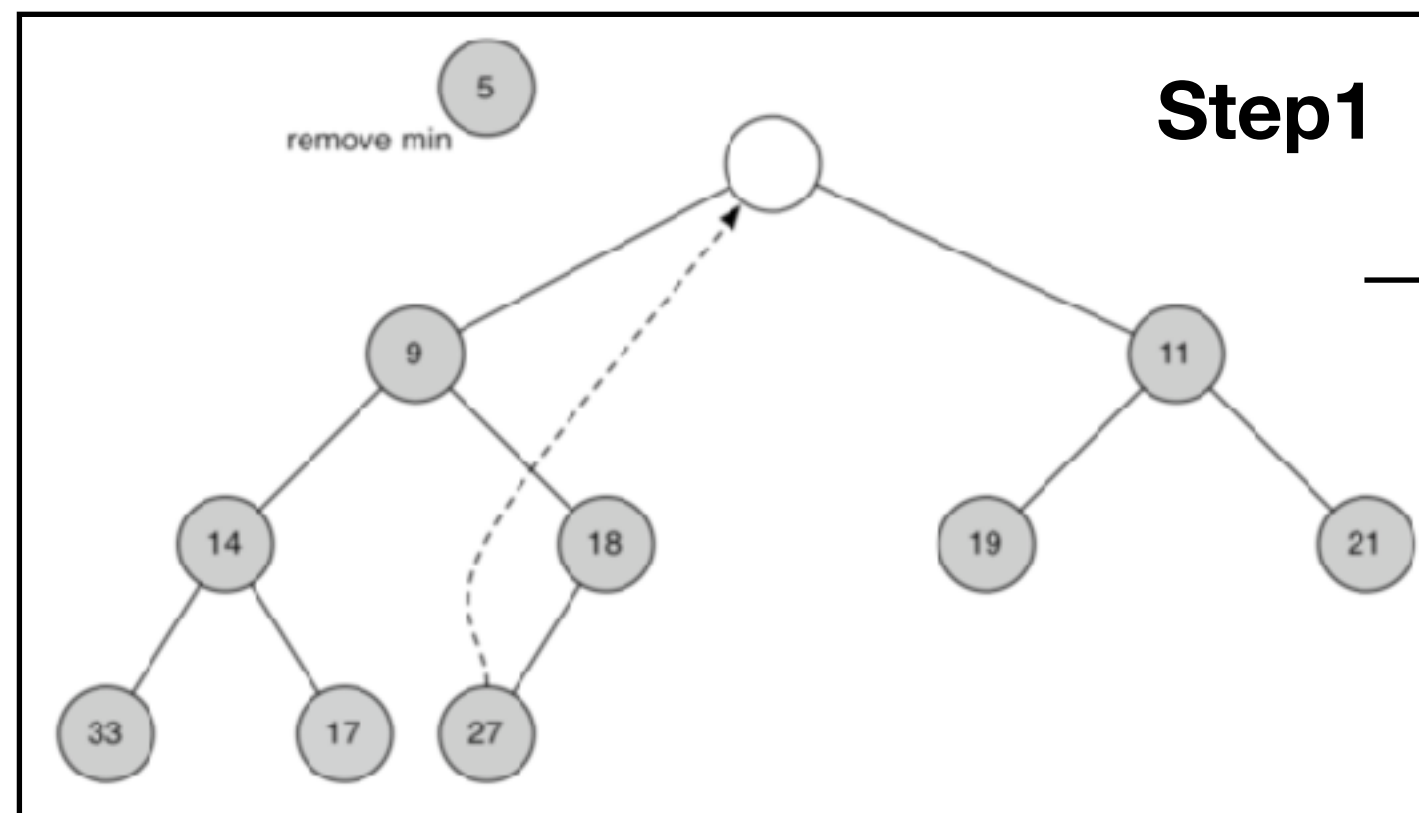
```
class BinHeap:
    def __init__(self):
        self.heapList = [0]
        self.currentSize = 0

    def insert(self, k):
        self.heapList.append(k)
        self.currentSize = self.currentSize + 1
        self.perUp(self.currentSize)

    def perUp(self, p):
        while p // 2 > 0:
            if self.heapList[p] < self.heapList[p // 2]:
                self.heapList[p], self.heapList[p // 2] = \
                    self.heapList[p // 2], self.heapList[p]
                p = p // 2
            else:
                break

    def findMin(self):
        if self.currentSize == 0:
            return None
        else:
            return self.heapList[1]
```


IMPLEMENTATION - delMin()



Complexity: the maximum height of tree is $\log(n)$, so after extracting the minimum element, we need to percolate down by doing maximum $\log(n)$ swap operations to ensure the heap property still works, thus $O(\log(n))$

```
class BinHeap:
    def __init__(self):
        self.heapList = [0]
        self.currentSize = 0

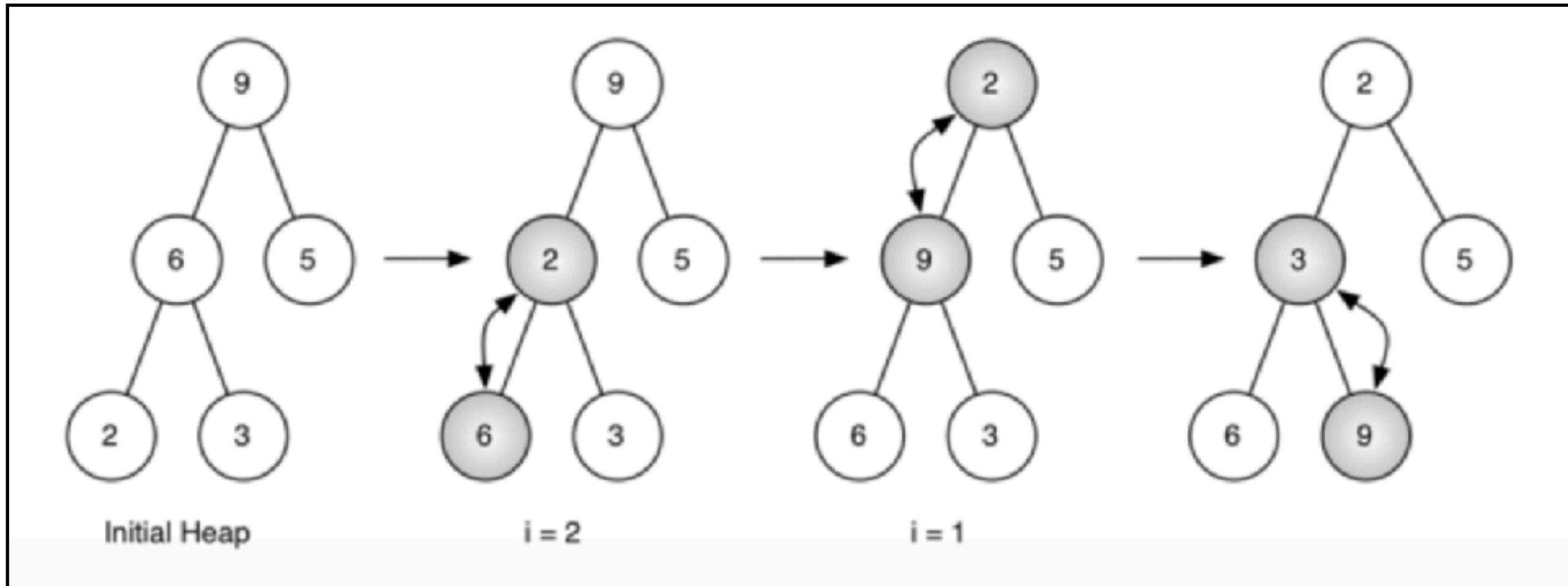
    def delMin(self):
        if self.currentSize == 0:
            return None
        retval = self.heapList[1]
        self.heapList[1] = self.heapList[self.currentSize]
        self.currentSize = self.currentSize - 1
        self.heapList.pop()
        self.perDown(1)
        return retval

    def perDown(self, p):
        while p * 2 <= self.currentSize:
            mc = self.minChild(p)
            if self.heapList[p] > self.heapList[mc]:
                self.heapList[p], self.heapList[mc] = \
                    self.heapList[mc], self.heapList[p]
            p = mc

    def minChild(self, p):
        if p * 2 + 1 > self.currentSize:
            return p * 2
        else:
            if self.heapList[p * 2] < self.heapList[p * 2 + 1]:
                return p * 2
            else:
                return p * 2 + 1
```

Heapify

IMPLEMENTATION - buildHeap(list)



Complexity: $O(n)$

$$\begin{aligned} & 1 \quad 2 \quad 4 \quad \boxed{8} \quad \boxed{16} \text{ leaves} \\ & \quad \quad \quad \dots \quad \frac{N}{8} \quad \frac{N}{4} \quad \frac{N}{2} \\ & \frac{N}{4} \cdot (1c) + \frac{N}{8} (2c) + \frac{N}{16} (3c) + \dots + 1 \cdot (\log N c) \\ & \text{Set } \frac{N}{4} = 2^k \\ & \rightarrow c \cdot 2^k \left(\frac{1}{2^0} + \frac{2}{2^1} + \frac{3}{2^2} + \dots + \frac{k+1}{2^k} \right) \\ & = c \cdot \frac{N}{4} \left[\sum_{i=0}^k \frac{i+1}{2^i} \right] \propto N \\ & \quad \quad \quad \text{Constant} \end{aligned}$$

```
class BinHeap:
    def __init__(self):
        self.heapList = [0]
        self.currentSize = 0

    def perDown(self, p):
        while p * 2 <= self.currentSize:
            mc = self.minChild(p)
            if self.heapList[p] > self.heapList[mc]:
                self.heapList[p], self.heapList[mc] = self.heapList[mc], self.heapList[p]
            p = mc

    def minChild(self, p):
        if p * 2 + 1 > self.currentSize:
            return p * 2
        else:
            if self.heapList[p * 2] < self.heapList[p * 2 + 1]:
                return p * 2
            else:
                return p * 2 + 1

    def buildHeap(self, alist):
        p = len(alist) // 2
        self.currentSize = len(alist)
        self.heapList = [0] + alist[:]
        while (p > 0):
            self.perDown(p)
            p -= 1
```

Heapify

APPLICATION

- HeapSort
- Find the kth smallest element
- Merge k Sorted Lists

APPLICATION: HeapSort

Pseudo algorithm

1. Build min_heap from unordered array - $O(n)$
2. Find min element and add to sorted array - $O(1)$
3. Discard minimum element from the heap - $O(\lg n)$
4. Repeat 2-3 until heap size is 0 - $O(n)$

Complexity

$O(n \log n)$

Question

How to do it in-place?

```
class BinHeap:
    def __init__(self):
        self.heapList = [0]
        self.currentSize = 0

    def perDown(self, p):
        while p*2 <= self.currentSize:
            mc = self.minChild(p)
            if self.heapList[p] > self.heapList[mc]:
                self.heapList[p], self.heapList[mc] = self.heapList[mc], self.heapList[p]
            p = mc

    def minChild(self, p):
        if p * 2 + 1 > self.currentSize:
            return p * 2
        else:
            if self.heapList[p*2] < self.heapList[p*2+1]:
                return p*2
            else:
                return p*2+1

    def buildHeap(self, alist):
        p = len(alist)//2
        self.currentSize = len(alist)
        self.heapList = [0] + alist[:]
        while (p>0):
            self.perDown(p)
            p -= 1

    def delMin(self):
        if self.currentSize == 0:
            return None
        retval = self.heapList[1]
        self.heapList[1] = self.heapList[self.currentSize]
        self.currentSize = self.currentSize - 1
        self.heapList.pop()
        self.perDown(1)
        return retval

    def heapSort(self, alist):
        aheap = self.buildHeap(alist)
        sorted_alist = []
        while self.currentSize > 0:
            sorted_alist.append(self.delMin())
        return sorted_alist
```

APPLICATION: Find kth smallest element

Pseudo algorithm

1. Build min_heap from unordered array - $O(n)$
2. Extract min element k times from min heap - $O(k \log n)$

Complexity

$O(n + k \log n)$

```
class BinHeap:
    def __init__(self):
        self.heapList = [0]
        self.currentSize = 0

    def perDown(self, p):
        while p * 2 <= self.currentSize:
            mc = self.minChild(p)
            if self.heapList[p] > self.heapList[mc]:
                self.heapList[p], self.heapList[mc] = self.heapList[mc], self.heapList[p]
            p = mc

    def minChild(self, p):
        if p * 2 + 1 > self.currentSize:
            return p * 2
        else:
            if self.heapList[p * 2] < self.heapList[p * 2 + 1]:
                return p * 2
            else:
                return p * 2 + 1

    def buildHeap(self, alist):
        p = len(alist) // 2
        self.currentSize = len(alist)
        self.heapList = [0] + alist[:]
        while (p > 0):
            self.perDown(p)
            p -= 1

    def delMin(self):
        if self.currentSize == 0:
            return None
        retval = self.heapList[1]
        self.heapList[1] = self.heapList[self.currentSize]
        self.currentSize = self.currentSize - 1
        self.heapList.pop()
        self.perDown(1)
        return retval

    def findKsmall(self, alist, k):
        aheap = self.buildHeap(alist)
        N = self.currentSize
        while self.currentSize != N - k:
            res = self.delMin()
        return res
```

APPLICATION: Merge k Sorted Lists (LC 23)

Merge k sorted linked lists and return it as one sorted list. Analyze and describe its complexity.

Example:

Input:

```
[  
  1->4->5,  
  1->3->4,  
  2->6  
]
```

Output: 1->1->2->3->4->4->5->6

```
class Solution:  
    def mergeKLists(self, lists):  
        """  
        :type lists: List[ListNode]  
        :rtype: ListNode  
        """  
  
        import heapq  
        heapList = []  
        for lst in lists:  
            while lst:  
                heapq.heappush(heapList, lst.val)  
                lst = lst.next  
  
        head = ListNode(0)  
        cur = head  
  
        while heapList:  
            cur.next = ListNode(heapq.heappop(heapList))  
            cur = cur.next  
  
        return head.next
```


Assignment

1. Implement Max-heap
2. Use max-heap to implement **in-place** HeapSort
3. LC 295: <https://leetcode.com/problems/find-median-from-data-stream/description/>
4. LC 264: <https://leetcode.com/problems/ugly-number-ii/description/>
5. LC 239: <https://leetcode.com/problems/sliding-window-maximum/description/>
6. LC 313: <https://leetcode.com/problems/super-ugly-number/description/>