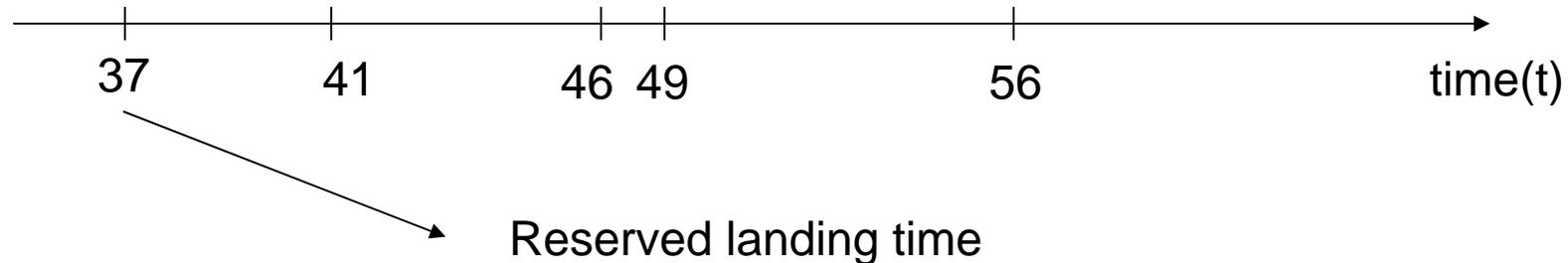


Priority queue & Heap

2008/3/7

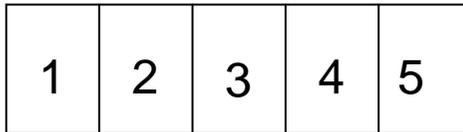
Review L3: Runway reservation system

- Problem:
 - Airport with single runway
 - Reservation for future landings (**insert**)
 - When plane lands, it is removed from the set of pending events (**extract-min**)



Review: the proposed solutions

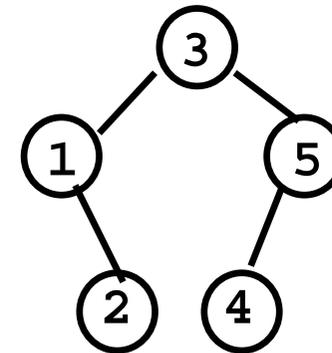
❑ Sorted array



❑ Dictionary

key	value
1	
2	
3	
4	
5	

❑ BST



❑ Performance:

- ❑ **Insert:** $O(n)$
- ❑ **Extract-min:** $O(1)$

❑ Performance:

- ❑ **Insert:** $O(1)$
- ❑ **Extract-min:** $O(n)$
- ❑ Good for **searching**, but not sorting

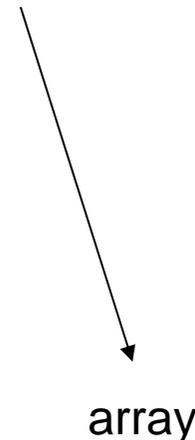
❑ Performance:

- ❑ **Insert:** $O(h)$
- ❑ **Extract-min:** $O(h)$
- ❑ $h = \log N$

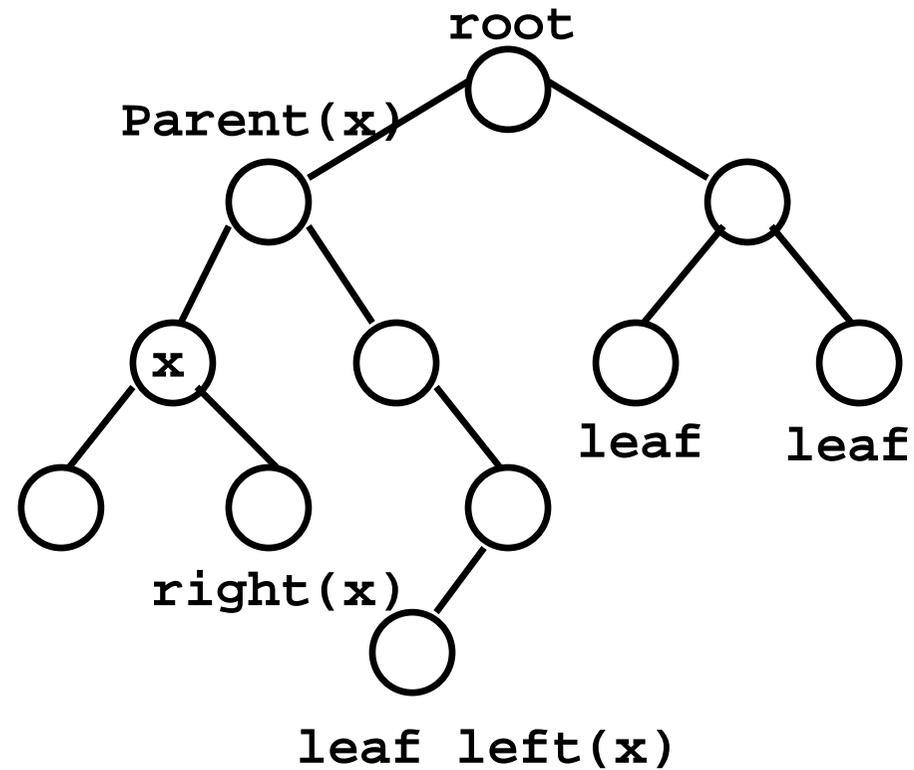
* **One more possible implementation: heap**

Review L8: Binary Heap

- ❑ definition: A Nearly complete binary tree
- ❑ Implementation: array!
- ❑ Property: Max-heap property
- ❑ Operations
 - ❑ **Max-Heapify(A,i)**
 - ❑ Maintain max-heap property of tree rooted at $A[i]$
 - ❑ **Build-max-heap(A)**
 - ❑ Convert an array A into a max-heap
 - ❑ **Heapsort (A)**
 - ❑ Sorting an array A



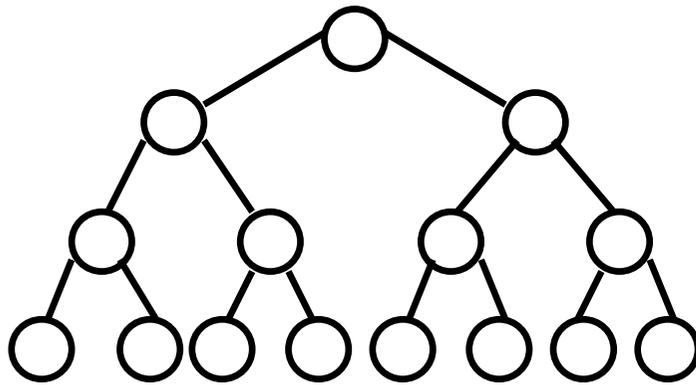
Binary Trees



- Binary search tree is a kind of binary tree.

Complete Binary Trees

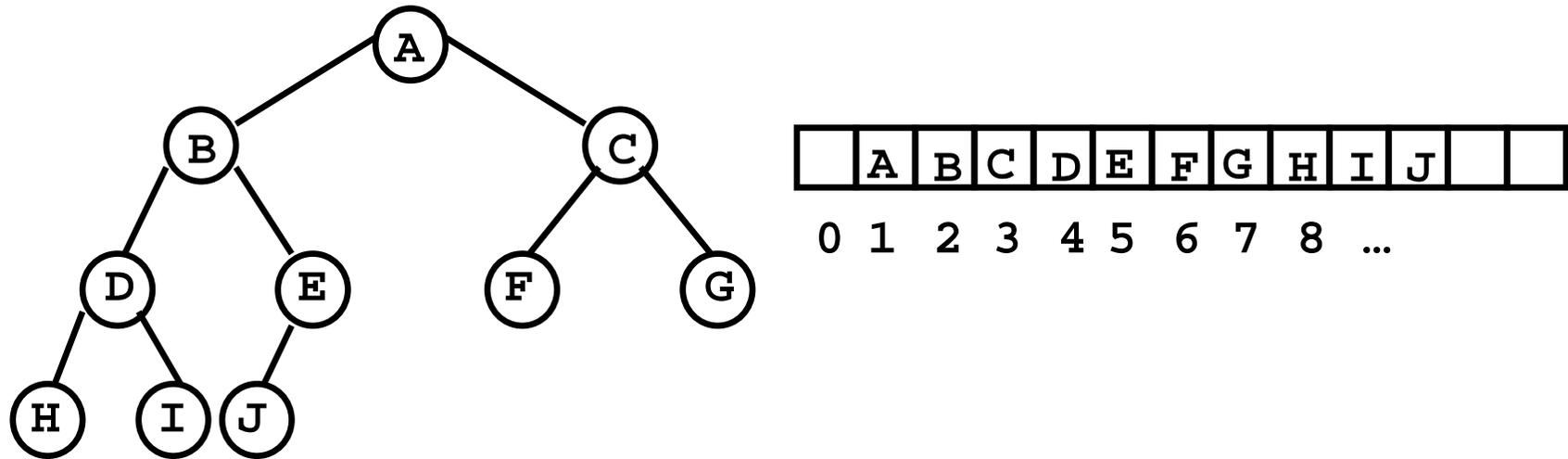
- Where a node can have 0 (for the leaves) or 2 children
- all leaves are at the same depth



height	no. of nodes
0	1
1	2
2	4
3	8
<hr/>	
d	2^d

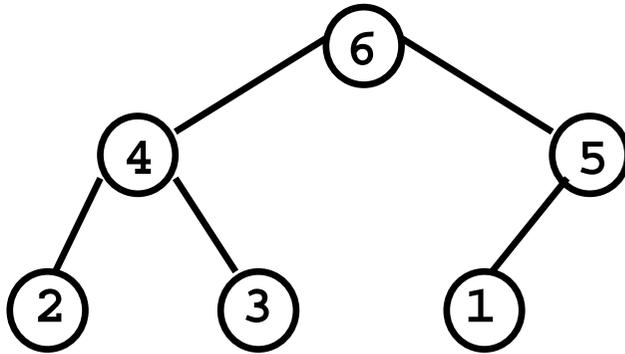
- A complete binary tree with N nodes has height $O(\log N)$

Array Implementation of Binary Heap

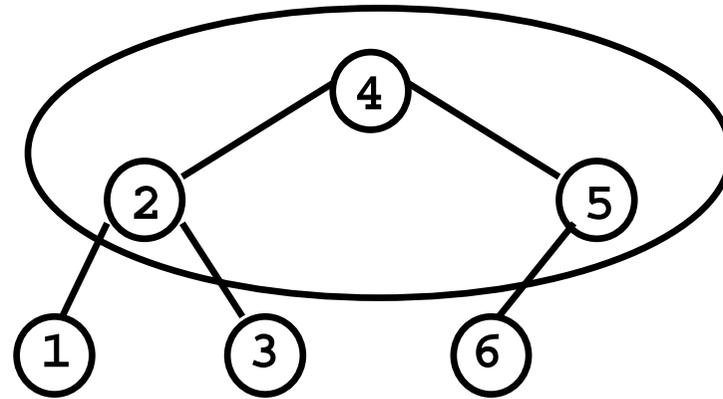


- For any element in array position i
 - The left child is in position $2i$
 - The right child is in position $2i+1$
 - The parent is in position $\text{floor}(i/2)$

Max-Heap-order property



A max-heap

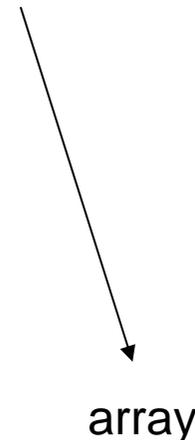


Not a max-heap

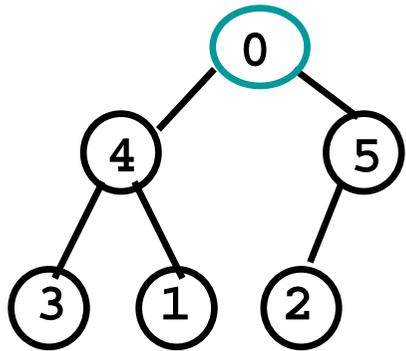
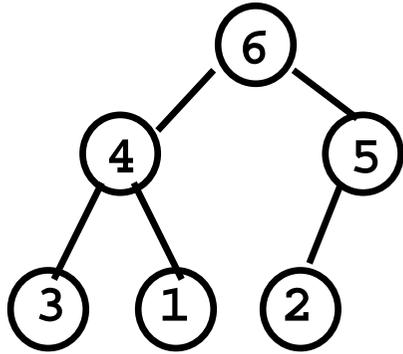
- the value at each node is less than or equal to the values at both its descendants

Review L8: Binary Heap

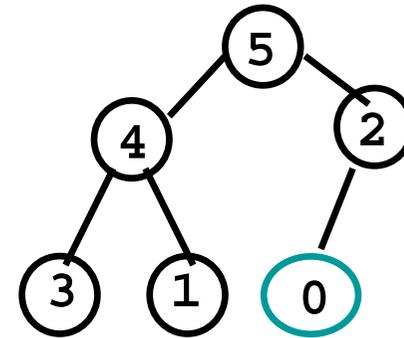
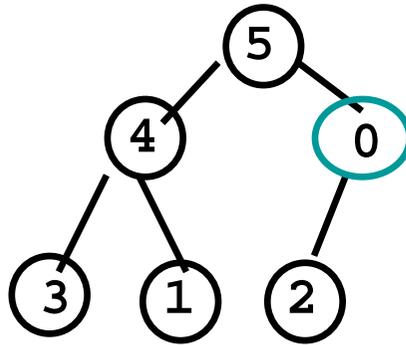
- ❑ definition: A Nearly complete binary tree
- ❑ Implementation: array!
- ❑ Property: Max-heap property
- ❑ Operations
 - ❑ **Max-Heapify(A,i)**
 - ❑ Maintain max-heap property of tree rooted at $A[i]$
 - ❑ **Build-max-heap(A)**
 - ❑ Convert an array A into a max-heap
 - ❑ **Heapsort (A)**
 - ❑ Sorting an array A



Max-heapify



Max-heapify(1)



Max-heapify(A,i)

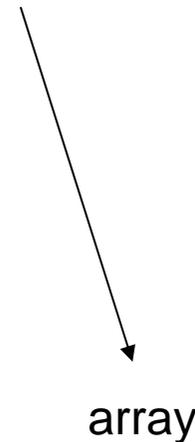
Time: $O(\log N)$

Max-heapify(A,i) #maintain max-heap property of tree rooted A[i]

1. **l<-left(i)**
2. **r<-right(i)**
3. #compare the value with left child
4. **if l<=heap-size(A) and A[l]>A[i]**
5. **then largest<-l**
6. **else largest<-i**
7. #compare the value with right child
8. **if r<=heap-size(A) and A[r]>A[largest]**
9. **then largest<-r**
10. # do swap if necessary and then call max-heapify again
11. **if largest≠i**
12. **then exchange A[largest]<->A[i]**
13. **Max-heapify(A,largest)**

Review L8: Binary Heap

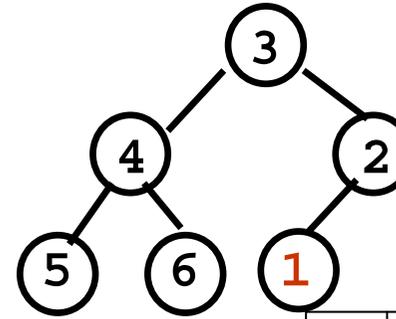
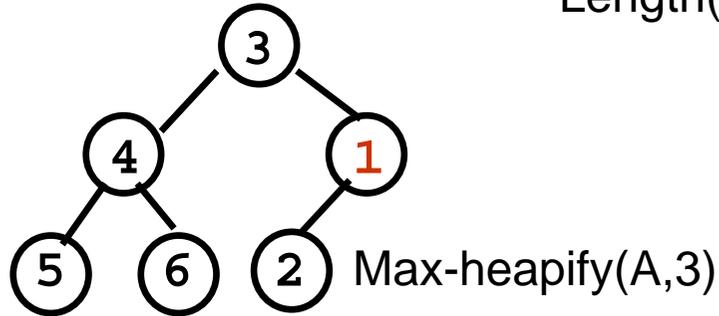
- ❑ definition: A Nearly complete binary tree
- ❑ Implementation: array!
- ❑ Property: Max-heap property
- ❑ Operations
 - ❑ **Max-Heapify(A,i)**
 - ❑ Maintain max-heap property of tree rooted at $A[i]$
 - ❑ **Build-max-heap(A)**
 - ❑ Convert an **array** A into a max-heap
 - ❑ **Heapsort (A)**
 - ❑ Sorting an **array** A



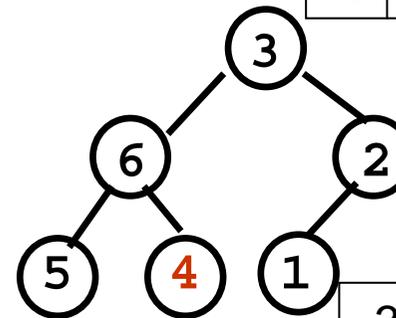
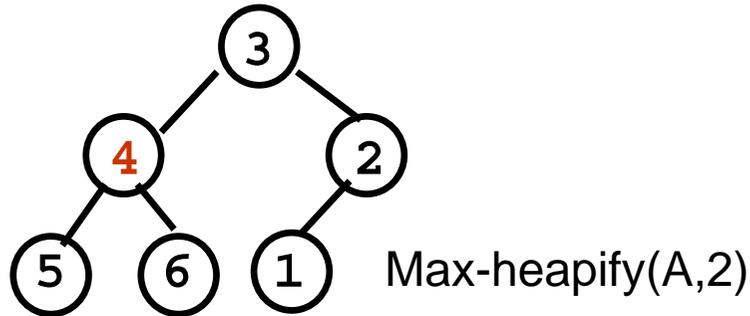
Build max-Heap

3	4	1	5	6	2
---	---	---	---	---	---

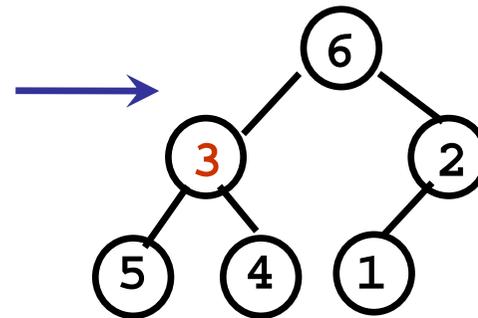
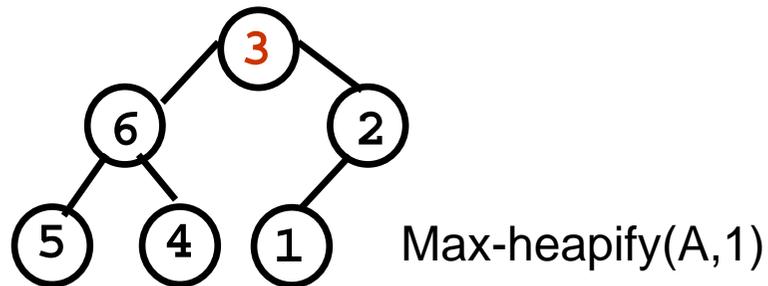
Length(A)=6



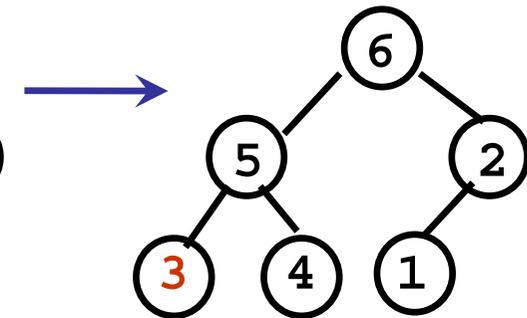
3	4	2	5	6	1
---	---	---	---	---	---



3	6	2	5	4	1
---	---	---	---	---	---



6	3	2	5	4	1
---	---	---	---	---	---



6	5	2	3	4	1
---	---	---	---	---	---

Build-max-Heap(A)

Build-max-Heap(A) #Convert an array A into a max-heap

1. **heap-size(A) ← length(A)**
2. **for i ← length(A)/2 down to 1**
3. **do Max-heapify(A,i)**

- Running time = $O(n)$

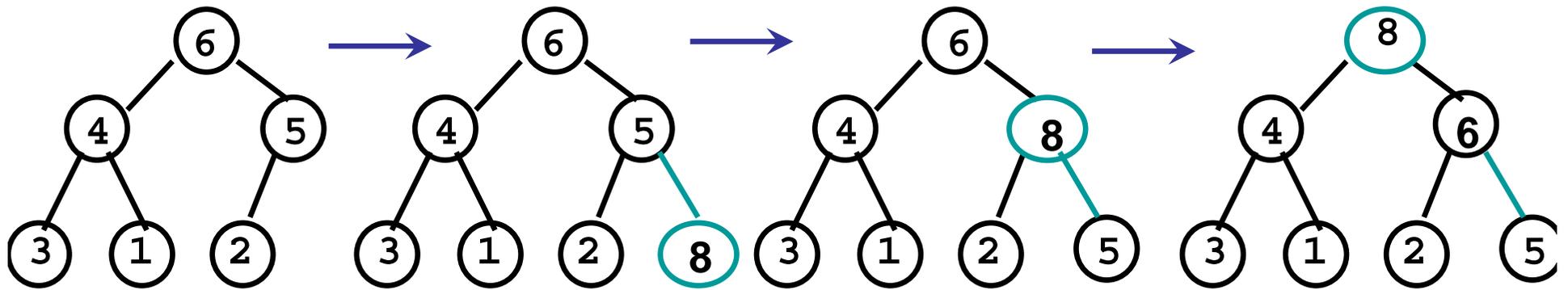
- * can also start from 1 to 1 down to length(A)/2, but that may need more calls for the method “max-heapify”

Heap is used to implement a priority queue, and runway-system is a kind of priority queue

Priority queue

- ❑ A priority queue is a data structure for maintaining a set of elements with values called keys
- ❑ Application:
 - ❑ Scheduling system (Runway system)
- ❑ Main Operations:
 - ❑ **Insert (A,k)**
 - ❑ Insert an element with key k into the **heap** A
 - ❑ **extract-max(A)**
 - ❑ Return element with the largest key from **heap** A
 - ❑ **increase-value(A,i,k)**
 - ❑ Update the key of element $A[i]$ to a new value k .
- ❑ Implementation
 - ❑ binary search tree
 - ❑ heap

insert



Insert 8

Insert(A,k)

Time: $O(\log N)$

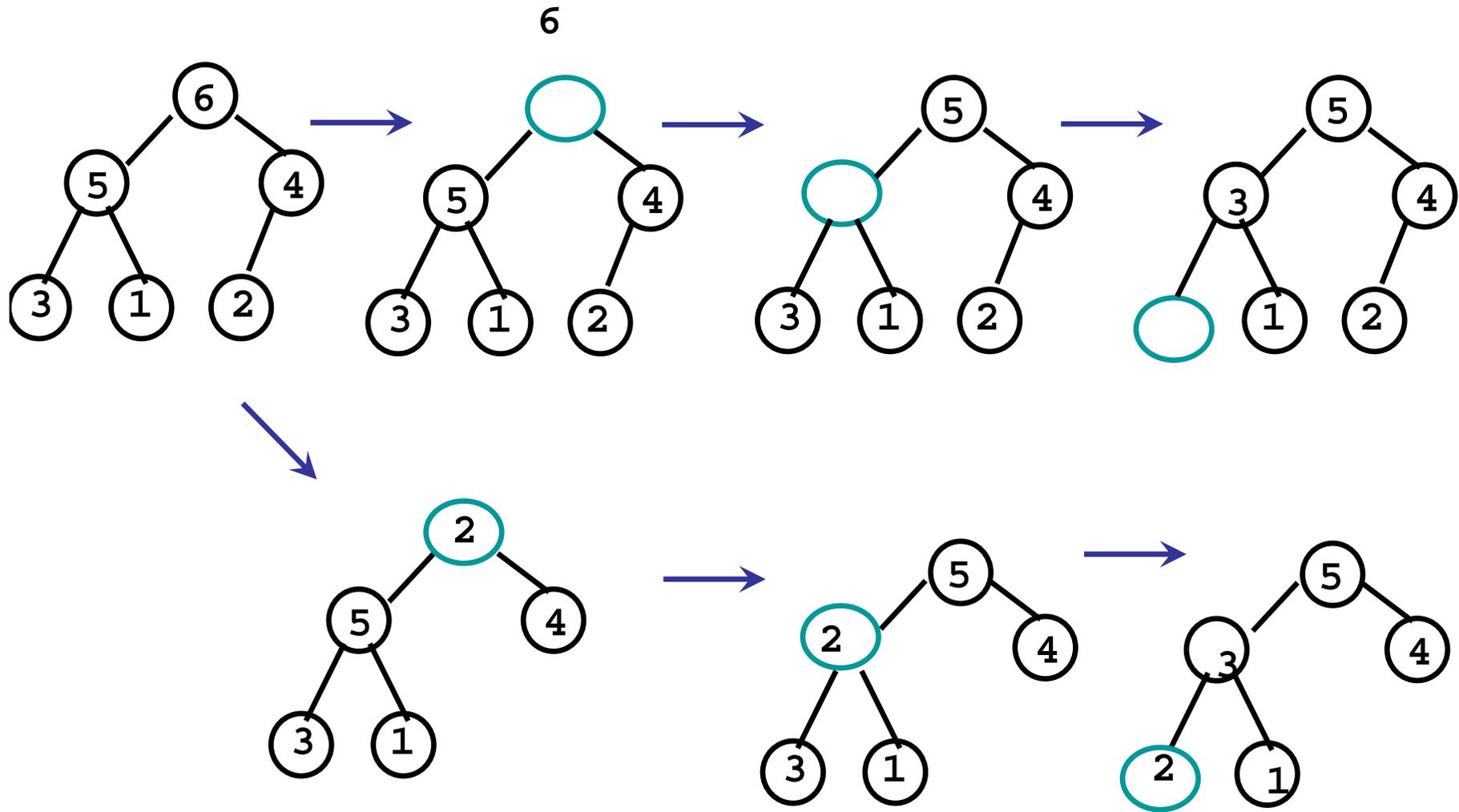
insert(A,k) # Insert an element with key k into heap A

1. **heap-size[A] \leftarrow heap-size[A] + 1**
2. **i \leftarrow heap-size[A]**
3. **A[i]=k**
4. # Insert it to next available position at the lowest level
5. **While i > 1 and A[parent(i)] < A[i]**
6. # traverse a path from this node toward the root to find a proper place until the max-heap property is maintained
7. **do exchange A[parent(i)] \leftrightarrow A[i]**
8. **i \leftarrow parent(i)**

Priority queue

- ❑ A priority queue is a data structure for maintaining a set of elements with values called keys
- ❑ Application:
 - ❑ Scheduling system (Runway system)
- ❑ Main Operations:
 - ❑ **Insert (A,k)**
 - ❑ Insert an element with key k into the heap A
 - ❑ **extract-max(A)**
 - ❑ Return element with the largest key from heap A
 - ❑ **increase-value(A,i,k)**
 - ❑ Update the key of element $A[i]$ to a new value k .
- ❑ Implementation
 - ❑ binary search tree
 - ❑ heap

extract-max



extract-max(A)

Time: $O(\log N)$

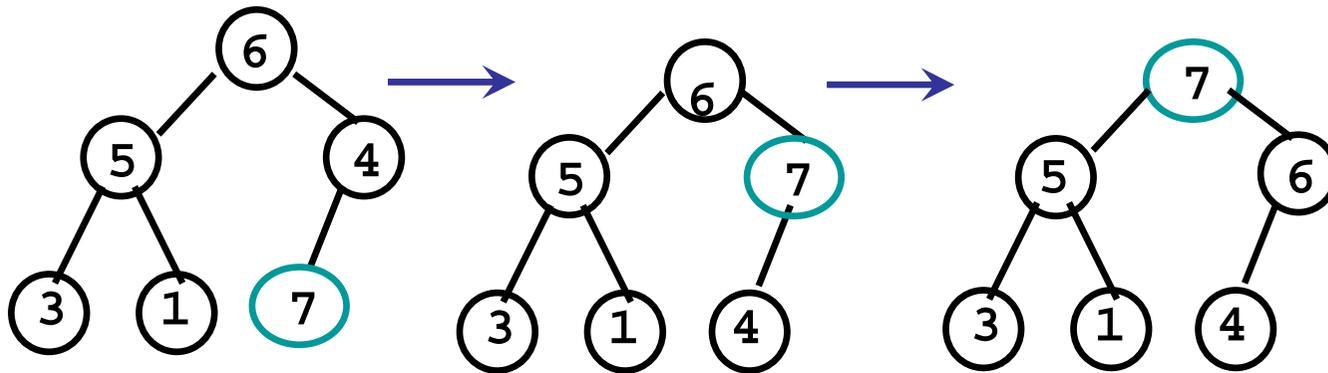
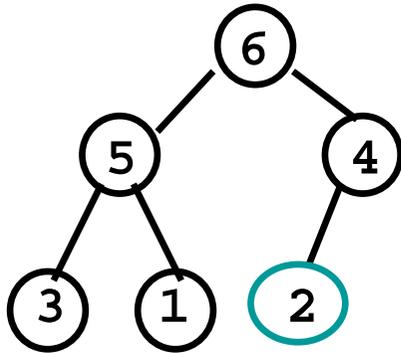
extract-max(A) #Return the largest key from heap A

1. **max** <- A[1]
2. **A[1]** <- A[heap-size(A)]
3. **heap-size(A)** <- heap-size(A)-1
4. **Max-heapify(A,1)**
5. **return max**

Priority queue

- ❑ A priority queue is a data structure for maintaining a set of elements with values called keys
- ❑ Application:
 - ❑ Scheduling system (Runway system)
- ❑ Main Operations:
 - ❑ **Insert (A,k)**
 - ❑ Insert an element with key k into the heap A
 - ❑ **extract-max(A)**
 - ❑ Return element with the largest key from heap A
 - ❑ **increase-value(A,i,k)**
 - ❑ Update the key of element $A[i]$ to a LARGER value k .
- ❑ Implementation
 - ❑ binary search tree
 - ❑ heap

Increase-key



increase-key(A,i,k) Time: $O(\log N)$

increase-key(A,i,k) # Update the key of A[i] to a new value , k.

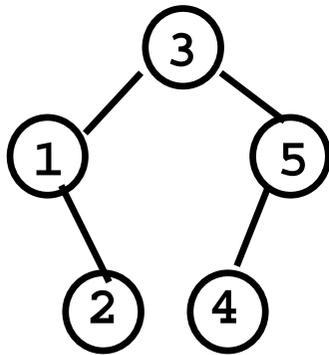
1. **A[i] \leftarrow k**
2. **While $i > 1$ and $A[\text{parent}(i)] < A[i]$**
3. # traverse a path from this node toward the root to find a proper place until the max-heap property is maintained
4. **do exchange $A[\text{parent}(i)] \leftrightarrow A[i]$**
5. **$i \leftarrow \text{parent}(i)$**

*Very similar to insert

*Do max-heapify when decrease-key(A,i,k)

Compare two implementations of priority queue

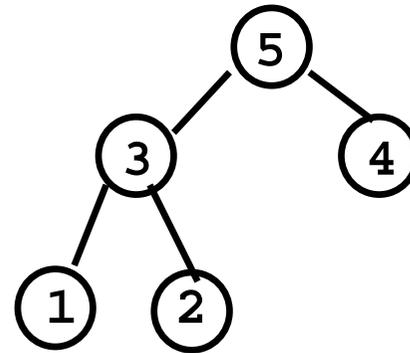
□ BST



□ Performance:

- **Insert:** $O(h)$
- **Extract-min:** $O(h)$
- $h = \log N$ (if BST is balanced)

• **Heap**



□ Performance:

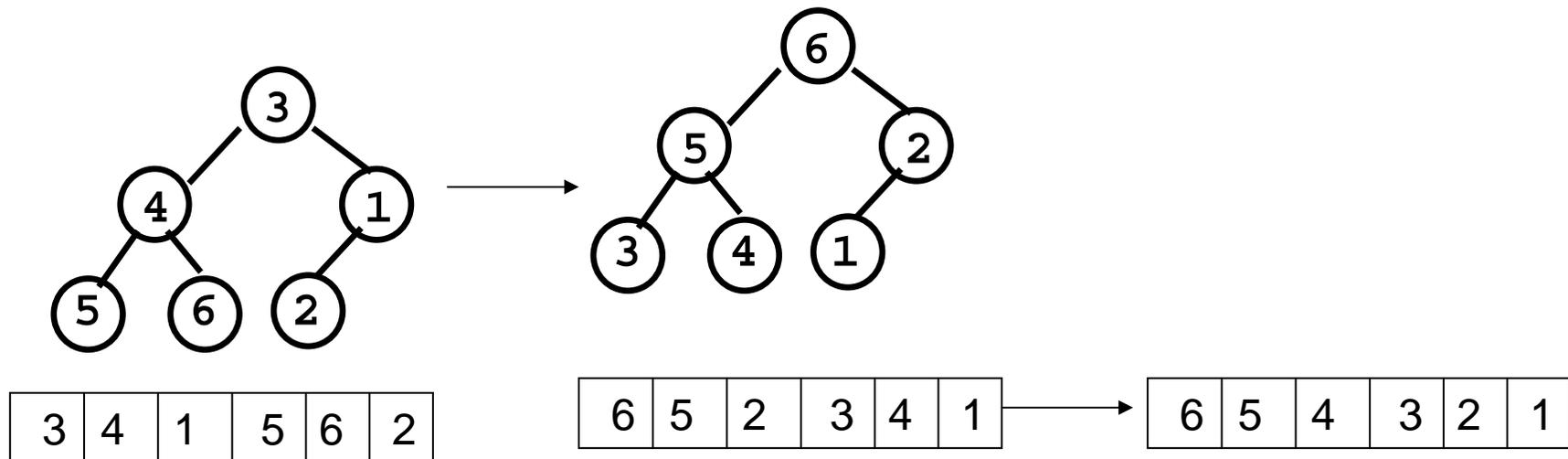
- **Insert:** $O(h)$
- **Extract-min:** $O(h)$
- $h = \log N$

Why is heap a better implementation of priority queue than BST?

Heap is used for sorting arrays

Sorting

- Problem: Given an array A, return an sorted array

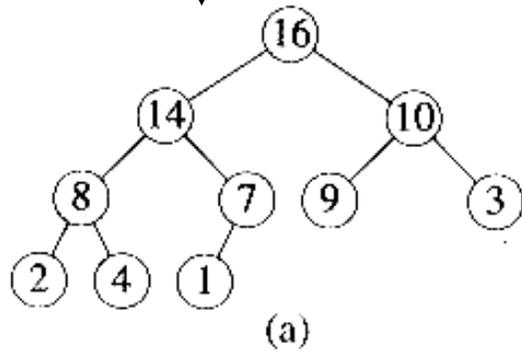


Build-max-heap is not all

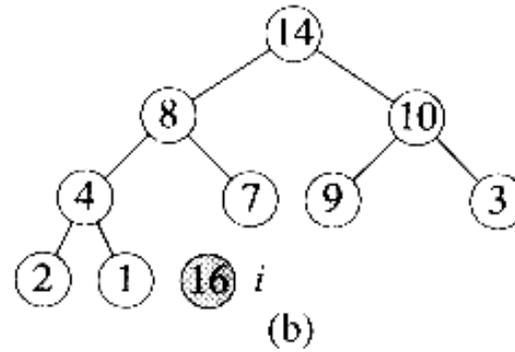
Heapsort (A)

[1,2,3,4,7,8,9,10,14,16]

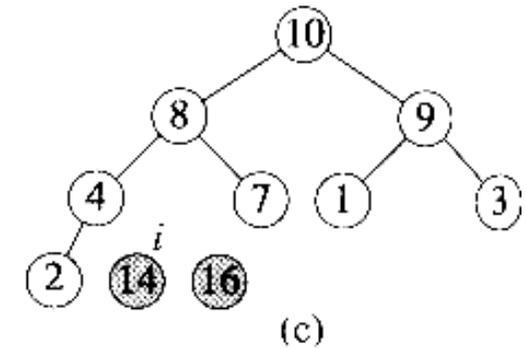
Build-max-heap(A)



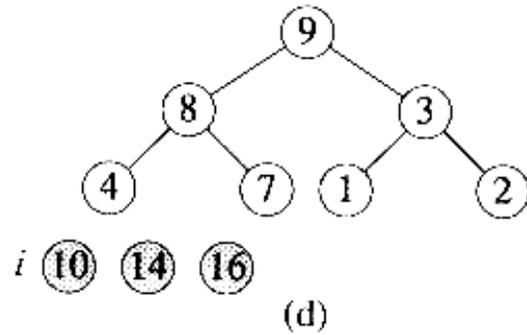
Delete 16



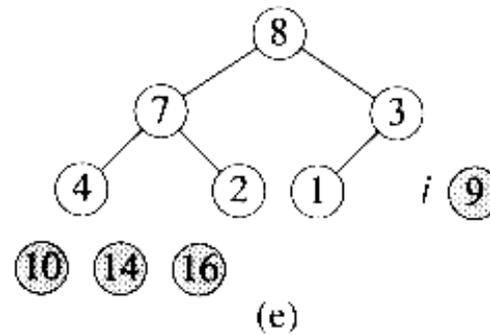
Delete 14



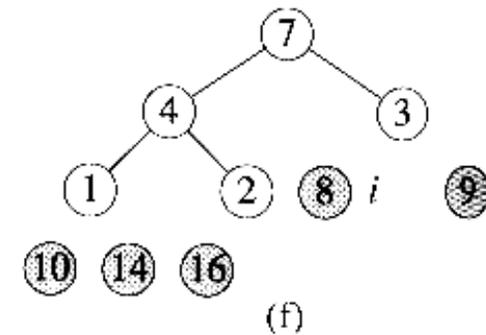
Delete 10



Delete 9



Delete 8



Heapsort(A)

Time: $O(N \log N)$

Heapsort(A) #sort an array A

1. **Build-max-Heap(A)** # the heap is built in A
2. **while heap-size(A) > 1**
3. **max = extract-max(A)**
4. **A[heap-size(A)] = max**

Heapsort(A)

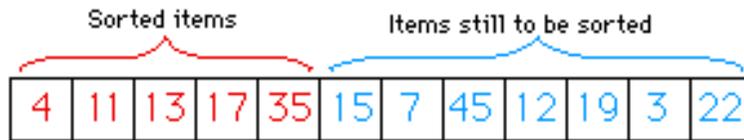
```
Heapsort(A) #sort an array A
1.   Build-max-Heap(A)    # the heap is built in A
2.   for i<- length(A) down to 2
3.       do exchange A[1]<->A[i]
4.       heap-size(A)<-heap-size(A)-1
5.       Max-heapify(A,1)
```

Review: all the sorting algorithms so far

- *All sorting algorithm stores data in an array,
but heap sort is efficient cause it can be
thought as a tree)

Review sortina Alg(1)-insertion sort

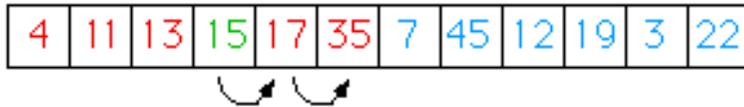
Start with a partially sorted list of items:



Temp: 15 Copy next unsorted item into Temp, leaving a "hole" in the array



Bump any items bigger than Temp up one space, then copy Temp into the "empty" location.



Now, the list of sorted items has increased in size by one item.

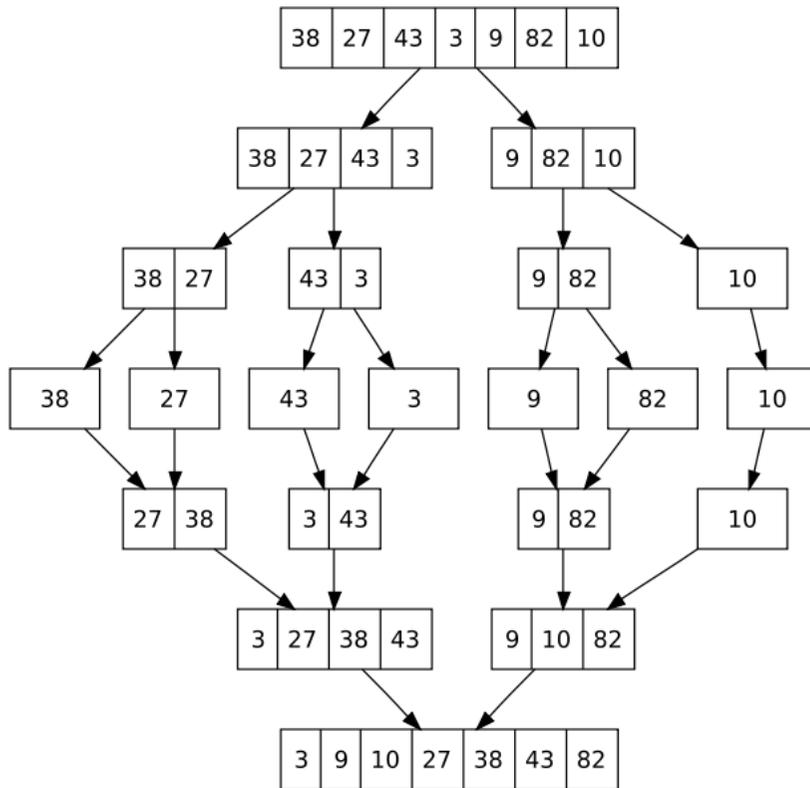
Running Time:

Worst: $(n-1)+(n-2)+\dots+(1)=(n-1)(n)/2=O(n^2)$

Best: $1+1+1+\dots+(n-1)=O(n)$

Sorting Alg	Insertion	Merge	selection	Heap
Memory	$O(1)$	$O(n)$	$O(1)$	$O(1)$
Time	$O(n^2)$	$O(n \log n)$	$O(n^2)$	$O(n \log n)$

Review sorting Alg(2)-merge sort

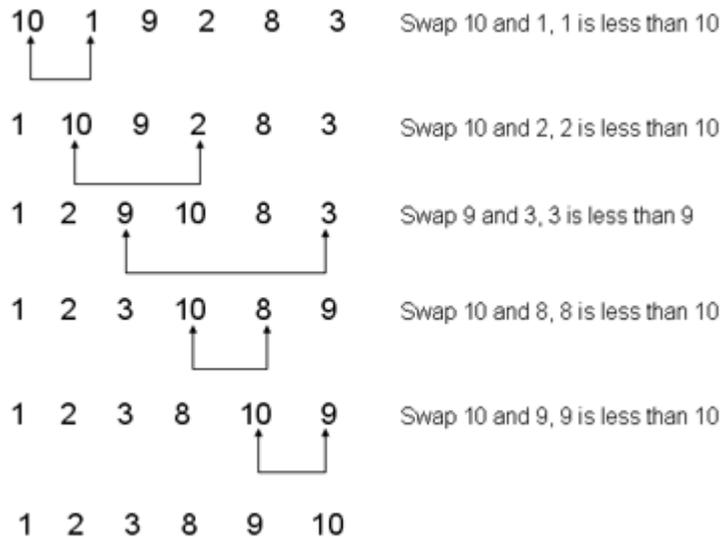


Running Time:

Worst, Best: $n+n+n+\dots+(n)=n\log n=O(n\log n)$

Sorting Alg	Insertion	Merge	selection	Heap
Memory	$O(1)$	$O(n)$	$O(1)$	$O(1)$
Time	$O(n^2)$	$O(n\log n)$	$O(n^2)$	$O(n\log n)$

Review sorting Alg(3)-selection sort



Given an array A with elements, $A[1], \dots, A[n]$

```

for i ← 1 to n-1
  do min ← i
  for j ← i+1 to n
    do if  $A[j] < A[\text{min}]$ 
      min ← j
   $A[i] \leftrightarrow A[\text{min}]$ 

```

Running time:

Worst,best: $(n-1)+(n-2)+\dots+(1)=(n-1)(n)/2=O(n^2)$

Sorting Alg	Insertion	Merge	selection	Heap
Memory	$O(1)$	$O(n)$	$O(1)$	$O(1)$
Time	$O(n^2)$	$O(n \log n)$	$O(n^2)$	$O(n \log n)$

Conclusion

- ❑ Heap supports methods
 - ❑ **Insert and extract-max**
 - ❑ Applied to **priority queue**
 - ❑ Better than **BST, sorted array**
 - ❑ **Heapsort**
 - ❑ Applied to **sorting**
 - ❑ Better than **insertion, merge, selection sort**

Reference

- www.cs.ust.hk/~qyang/171/heapsort.ppt
- <http://ww3.algorithmdesign.net/handouts/Heap.pdf>