

# Priority Queues

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- Priority Queues
- Trees and Heaps
- Representations of Heaps
- Algorithms on Heaps
- Building a Heap
- Heapsort

Philip Bille

# Priority Queues

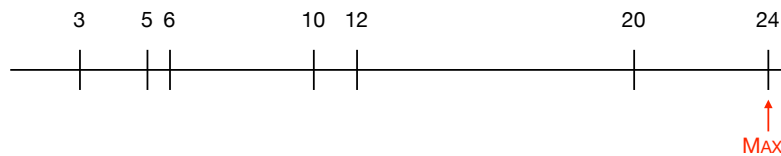
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# Priority Queues

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- **Priority queues.** Maintain dynamic set  $S$  supporting the following operations. Each element has key  $x.key$  and satellite data  $x.data$ .
  - $MAX()$ : return element with **largest** key.
  - $EXTRACTMAX()$ : return **and remove** element with **largest** key.
  - $INCREASEKEY(x, k)$ : set  $x.key = k$ . (assume  $k \geq x.key$ )
  - $INSERT(x)$ : set  $S = S \cup \{x\}$



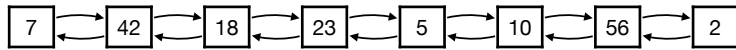
# Priority Queues

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- **Applications.**
  - Scheduling
  - Shortest paths in graphs (Dijkstra's algorithm)
  - Minimum spanning trees in graphs (Prim's algorithm)
  - Compression (Huffman's algorithm)
  - ...
- **Challenge.** How can we solve problem with current techniques?

## Priority Queues

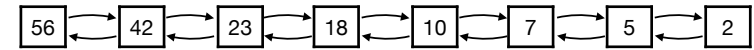
- **Solution 1: Linked list.** Maintain S in a doubly-linked list.



- MAX(): linear search for largest key.
- EXTRACTMAX(): linear search for largest key. Remove and return element.
- INCREASEKEY(x, k): set x.key = k.
- INSERT(x): add element to front of list (assume element does not exist in S beforehand).
- **Time.**
  - MAX and EXTRACTMAX in  $O(n)$  time ( $n = |S|$ ).
  - INCREASEKEY and INSERT in  $O(1)$  time.
- **Space.**
  - $O(n)$ .

## Priority Queues

- **Solution 2: Sorted linked list.** Maintain S in a **sorted** doubly-linked list.



- MAX(): return first element.
- EXTRACTMAX(): return and remove first element.
- INCREASEKEY(x, k): set x.key = k. Linear search to move x to correct position.
- INSERT(x): linear search to insert x at correct position.
- **Time.**
  - MAX and EXTRACTMAX in  $O(1)$  time.
  - INCREASEKEY and INSERT in  $O(n)$  time.
- **Space.**
  - $O(n)$ .

## Priority Queues

Data structure	MAX	EXTRACTMAX	INCREASEKEY	INSERT	Space
linked list	$O(n)$	$O(n)$	$O(1)$	$O(1)$	$O(n)$
sorted linked list	$O(1)$	$O(1)$	$O(n)$	$O(n)$	$O(n)$

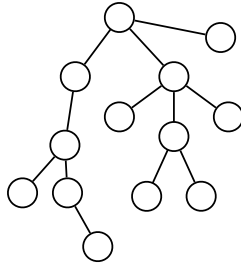
- **Challenge.** Can we do significantly better?

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## Trees

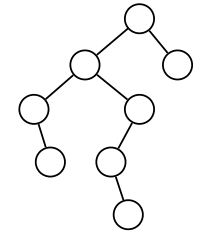
- **Rooted trees.**
  - **Nodes (or vertices)** connected with **edges**.
  - **Connected** and **acyclic**.
  - Designated **root node**.
  - Special type of **graph**.



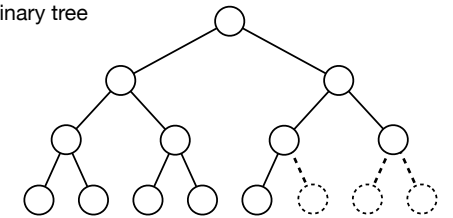
- **Terminology.**
  - Children, parent, descendant, ancestor, leaves, internal nodes, path,...
- **Depth and height.**
  - **Depth** of  $v$  = length of path from  $v$  to root.
  - **Height** of  $v$  = length of path from  $v$  to descendant leaf.
  - Depth of  $T$  = height of  $T$  = length of longest path from root to a leaf.

## Trees

- **Binary tree.**
  - Rooted tree.
  - Each node has at most two children called the **left child** and **right child**
- **Complete binary tree.** Binary tree where all levels of tree are **full**.
- **Almost complete binary tree.** Complete binary tree with 0 or more rightmost leaves deleted.



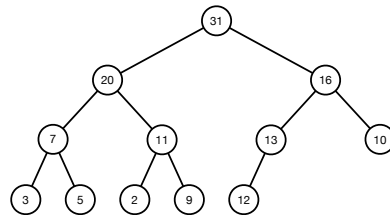
- **Lemma.** Height of an (almost) complete binary tree with  $n$  nodes is  $\Theta(\log n)$ .
- **Pf.** See exercises.



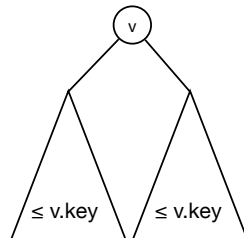
## Heaps

- **Heaps.** Almost complete binary tree. All nodes store one element and the tree satisfies **heap-order**.

- **Heap-order.**
  - For all nodes  $v$ :
    - all keys in left subtree and right subtree are  $\leq v.key$ .



- **Max-heap vs min-heap.**



## Priority Queues

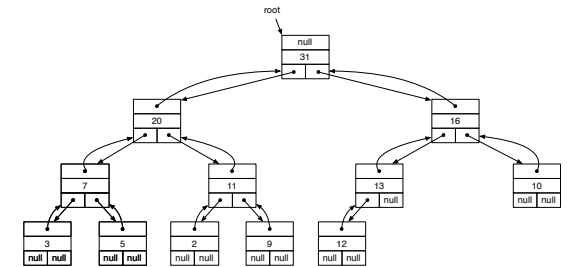
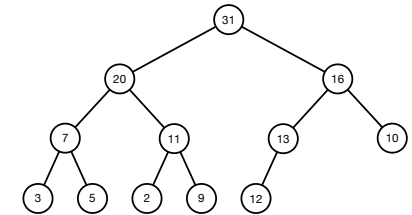
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# Heap

- **Data structure.** We need the following navigation operations on a heap.
  - PARENT(x): return parent of x.
  - LEFT(x) : return left child of x.
  - RIGHT(x): return right child of x.
- **Challenge.** How can we represent a heap compactly to support fast navigation?

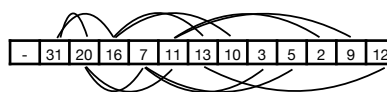
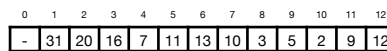
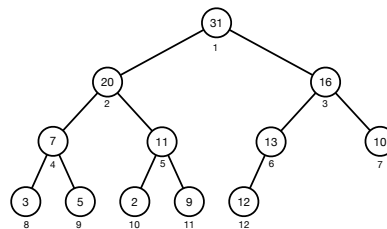
# Heap

- **Linked representation.** Each node stores
  - v.key
  - v.parent
  - v.left
  - v.right
- PARENT, LEFT, RIGHT by following pointer.
- **Time.** O(1)
- **Space.** O(n)



# Heap

- **Array representation.**
  - Array H[0..n]
  - H[0] unused
  - H[1..n] stores nodes in **level order**.
- PARENT(x): return  $\lfloor x/2 \rfloor$
- LEFT(x) : return 2x.
- RIGHT(x): return 2x + 1
- **Time.** O(1)
- **Space.** O(n)

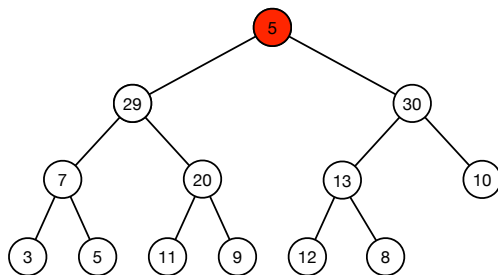
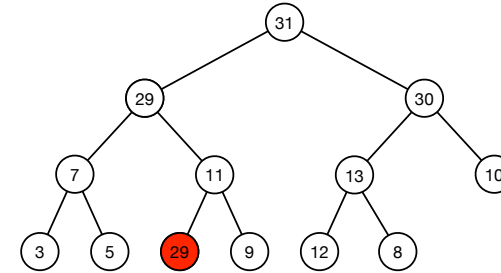
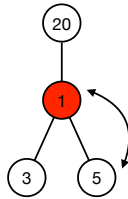
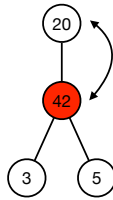


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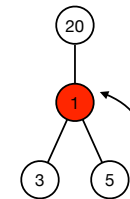
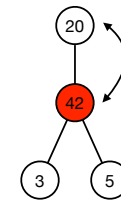
## Algorithms on Heaps

- BUBBLEUP(x):
  - If heap order is violated at node x because key is larger than key at parent:
  - Swap x and parent
  - Repeat with parent until heap order is satisfied.
- BUBBLEDOWN(x):
  - If heap order is violated at node x because key is smaller than key at left or right child:
  - Swap x and child c with **largest** key.
  - Repeat with child until heap order is satisfied.



## Algorithms on Heaps

- BUBBLEUP(x):
  - If heap order is violated at node x because key is larger than key at parent:
  - Swap x and parent
  - Repeat with parent until heap order is satisfied.
- BUBBLEDOWN(x):
  - If heap order is violated at node x because key is smaller than key at left or right child:
  - Swap x and child c with **largest** key.
  - Repeat with child until heap order is satisfied.
- Time.
  - BUBBLEUP and BUBBLEDOWN in  $O(\log n)$  time.
- How can we use them to implement a priority queue?



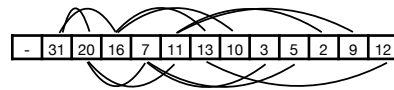
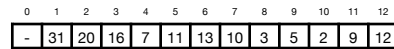
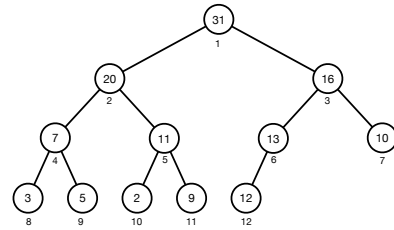
## Priority Queues

**MAX()**  
return  $H[1]$

**INSERT(x)**  
 $n = n + 1$   
 $H[n] = x$   
BUBBLEUP(n)

**EXTRACTMAX()**  
 $r = H[1]$   
 $H[1] = H[n]$   
 $n = n - 1$   
BUBBLEDOWN(1)  
return r

**INCREASEKEY(x, k)**  
 $H[x] = k$   
BUBBLEUP(x)



- Ex. Trace execution of following sequence in initially empty heap: 2, 5, 7, 6, 4, E, E
- Numbers mean INSERT and E is EXTRACTMAX. Draw heap after each operation.

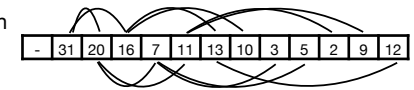
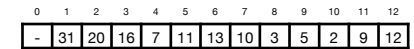
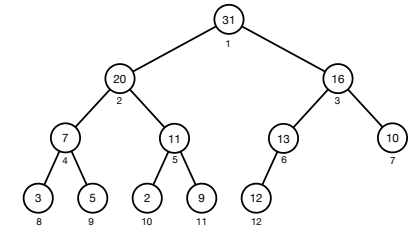
## Priority Queues

**MAX()**  
return  $H[1]$

**INSERT(x)**  
 $n = n + 1$   
 $H[n] = x$   
BUBBLEUP(n)

**EXTRACTMAX()**  
 $r = H[1]$   
 $H[1] = H[n]$   
 $n = n - 1$   
BUBBLEDOWN(1)  
return r

**INCREASEKEY(x, k)**  
 $H[x] = k$   
BUBBLEUP(x)



- Time.
  - MAX in  $O(1)$  time.
  - EXTRACTMAX, INCREASEKEY, and INSERT in  $O(\log n)$  time.

## Priority Queues

Data structure	MAX	EXTRACTMAX	INCREASEKEY	INSERT	Space
linked list	$O(n)$	$O(n)$	$O(1)$	$O(1)$	$O(n)$
sorted linked list	$O(1)$	$O(1)$	$O(n)$	$O(n)$	$O(n)$
heap	$O(1)$	$O(\log n)$	$O(\log n)$	$O(\log n)$	$O(n)$

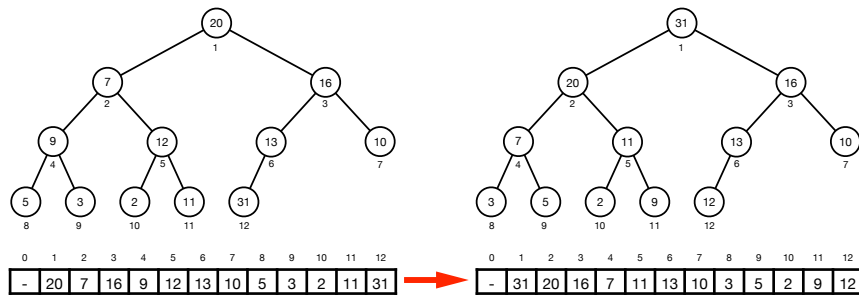
- Heaps with array data structure is an example of an **implicit data structure**.

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## Building a Heap

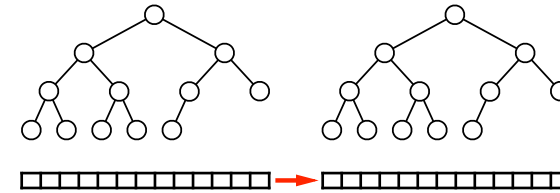
- **Building a heap.** Given  $n$  integers in a array  $H[1..n]$ , convert array to a heap.



## Building a Heap

- **Solution 1: top-down construction**

- For all nodes in increasing level order apply BUBBLEUP.



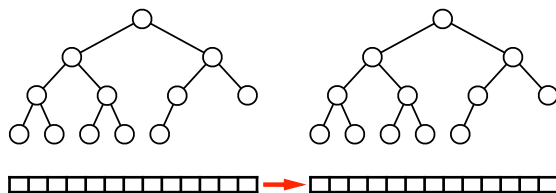
- **Time.**

- For each node of depth  $d$ , we use  $O(d)$  time.
- 1 node of depth 0, 2 nodes of depth 1, 4 nodes of depth 2, ...,  $\sim n/2$  nodes of depth  $\log n$ .
- $\Rightarrow$  total time is  $O(n \log n)$
- **Challenge.** Can we do better?

## Building a Heap

- **Solution 2: bottom-up construction**

- For all nodes in decreasing level order apply BUBBLEDOWN.



- **Time.**

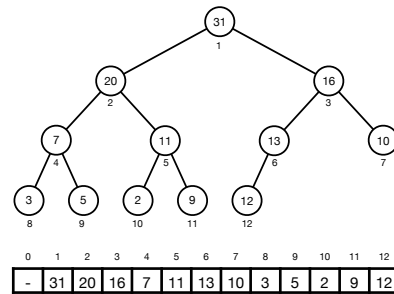
- For each node of height  $h$  we use  $O(h)$  time.
- 1 node of height  $\log n$ , 2 nodes of height  $\log n - 1$ , ...,  $n/4$  nodes of height 1,  $n/2$  nodes of height 0.
- $\Rightarrow$  total time is  $O(n)$  (see exercise)

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## Heapsort

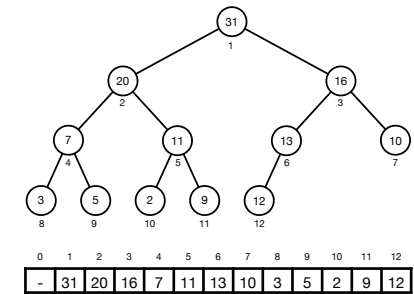
- **Sorting.** How can we sort an array  $H[1..n]$  using a heap?
- **Solution.**
  - Build a heap for  $H$ .
  - Apply  $n$  EXTRACTMAX.
    - Insert results in the end of array.
  - Return  $H$ .



- **Time.**
  - Heap construction in  $O(n)$  time.
  - $n$  EXTRACTMAX in  $O(n \log n)$  time.
  - $\Rightarrow$  total time is  $O(n \log n)$ .

## Heapsort

- **Theorem.** We can sort an array in  $O(n \log n)$  time.
- Uses only  $O(1)$  extra space.
- **In-place** sorting algorithm.



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