

# CIS 313: Intermediate Data Structure

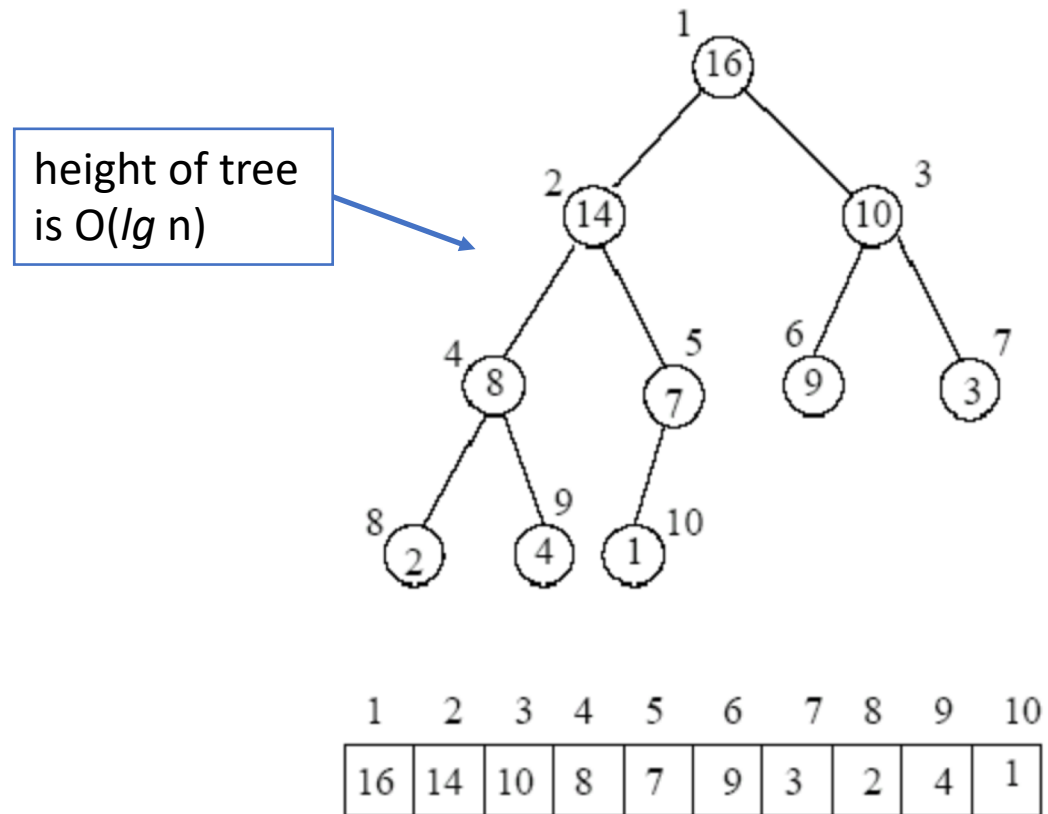
third slide

# binary heap implementation of PQ

- most common implementation
- operations are  $O(\log n)$
- uses a binary tree structure
- except that the tree is stored in an array with no pointers
- it is an *implicit* tree, children and parents inferred from location in array
  
- PQSort becomes *heapsort*

# binary heap

- stored in array
- item located in position  $i$ 
  - parent in location  $\lfloor i/2 \rfloor$
  - left child in position  $2i$
  - right child in position  $2i + 1$
- tree is complete
  - all nodes have two children, except maybe parent of “last” one
- tree maintains heap property
  - value stored at location  $i$  is greater than or equal to values stored in both its children
- fact: a binary heap with  $n$  elements has the height of  $\lfloor \lg n \rfloor$  (why?)



# binary heap insertion

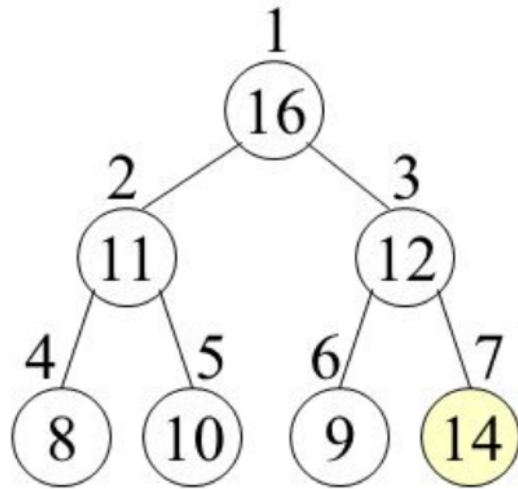
- put new value  $x$  at end of array, extending its size by 1
- value  $x$  is now viewed as being at the bottom of the tree
- if  $x$  violates heap property (if larger than parent), swap with parent
- repeat until no violation
- time is proportional to height of tree, which is  $O(\lg n)$
- text handles this differently, they insert  $-\infty$  and then use heap-increase-key to the new value

# pseudo-code for insert

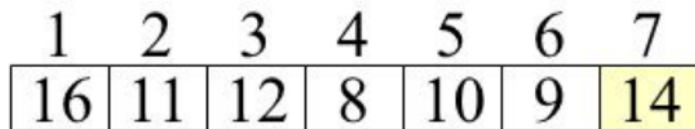
```
insert(x):  
  
heapsize++  
A[heapsize]=x  
  
i = heapsize  
while i>1 and A[i]>A[parent(i)]  
    swap A[i] and A[parent(i)]  
    i = parent(i)
```

sometimes called “sift-up”  
or “bubble-up”

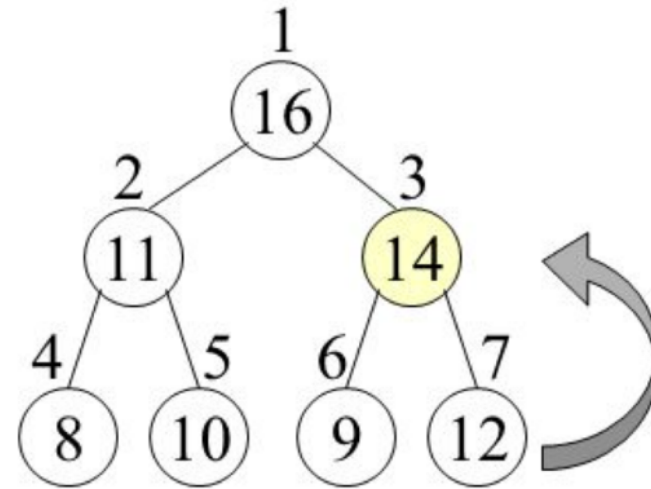
# Binary Heap : Insert Operation



viewed as a binary tree



viewed as an array



viewed as a binary tree



viewed as an array

# heap extract-max (deletion)

- similar but element moves down
- idea: remove and return root (in location 1 of the tree)
- move rightmost element into that empty location ...
- ... and reduce the heapsize
- tree shape is maintained but root location may violate heap property
- note: rest of tree still has heap property
- swap node with *larger* (why) of it's children
- repeat while heap property violated until leaf hit
- called “sift-down” or “bubble-down”

# text algorithm

MAX-HEAPIFY( $A, i$ )

*// Input: A: an array where the left and right children of  $i$  root heaps (but  $i$  may not),  $i$ : an array index*

*// Output: A modified so that  $i$  roots a heap*

*// Running Time:  $O(\log n)$  where  $n = \text{heap-size}[A] - i$*


```
1  $l = \text{LEFT}(i)$ 
2  $r = \text{RIGHT}(i)$ 
3 if  $l \leq A.\text{heap-size}$  and  $A[l] > A[i]$ 
4      $largest = l$ 
5 else  $largest = i$ 
6 if  $r \leq A.\text{heap-size}$  and  $A[r] > A[largest]$ 
7      $largest = r$ 
8 if  $largest \neq i$ 
9     exchange  $A[i]$  with  $A[largest]$ 
10    MAX-HEAPIFY( $A, largest$ )
```



# first attempt at sorting

1. for each element  $x$ , *insert*  $x$  into a heap
  - time per insert  $O(\lg n)$ , total  $O(n \lg n)$
  - this can be made much faster
2. while the heap is not empty, *extract-max*
  - output is a sorted list (reversed)
  - each extract-max is  $O(\lg n)$ , total  $O(n \lg n)$
  - cannot be made faster

BUILDHEAP uses deletion idea to get linear overall time



# buildheap code

BUILD-MAX-HEAP( $A$ )

*// Input:  $A$ : an (unsorted) array*

*// Output:  $A$  modified to represent a heap.*

*// Running Time:  $O(n)$  where  $n = \text{length}[A]$*

1  $\text{heap-size}[A] \leftarrow \text{length}[A]$

2 **for**  $i \leftarrow \lfloor \text{length}[A]/2 \rfloor$  **downto** 1

3     MAX-HEAPIFY( $A, i$ )

correctness

- idea sort of clear, build heaps bottom up
- text uses loop invariant!!

time analysis

if tree has height  $H = \lg n$

- all nodes at level  $k$  take time  $H - k$  to sift down
- there are  $2^k$  nodes at level  $k$
- total time is  $\sum_0^H 2^k (H - k)$
- can show this is at most  $2n$

# grinding through the time bound

$$\sum_{k=0}^H 2^k (H - k) = 2^H \sum_{k=0}^H (2^k / 2^H) (H - k)$$

$$= n \cdot \sum_{k=0}^H \frac{1}{2^{H-k}} (H - k)$$

$$= n \cdot \sum_{i=0}^H \frac{i}{2^i} \leq n \cdot \sum_{i=0}^{\infty} \frac{i}{2^i} = 2 \cdot n$$

$$2^H \approx 2^{\log_2 n} = n$$

re-index

why just 2?

- mentioned but not proved in appendix
- “fun” to derive

• can also take derivative of  $\sum_{k=0}^{\infty} x^k = \frac{1}{1-x}$

# now heapsort

```
HEAP-SORT( $A$ )  
  // Input:  $A$ : an (unsorted) array  
  // Output:  $A$  modified to be sorted from smallest to largest  
  // Running Time:  $O(n \log n)$  where  $n = \text{length}[A]$   
1  BUILD-MAX-HEAP( $A$ )  
2  for  $i = \text{length}[A]$  downto 2  
3    exchange  $A[1]$  and  $A[i]$   
4     $\text{heap-size}[A] \leftarrow \text{heap-size}[A] - 1$   
5    MAX-HEAPIFY( $A, 1$ )
```

step 1:  $\Theta(n)$  time

steps 2-5:  $\Theta(n \log n)$  time

# other heap operation: increase-key

- an item can be increased in  $O(\lg n)$  time
- after the increase, it would need to be sifted up as in the insert method
- the same applies to the decrease-key operation in a min heap
- this operation is a crucial step in Dijkstra's method (shortest path) and Prim's method (minimum spanning tree)
- it can be implemented in  $O(1)$  amortized time using Fibonacci heaps

# summary

Procedure	Binary heap (worst-case)
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MAKE-HEAP	$\Theta(1)$
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INSERT	$\Theta(\lg n)$
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MINIMUM	$\Theta(1)$
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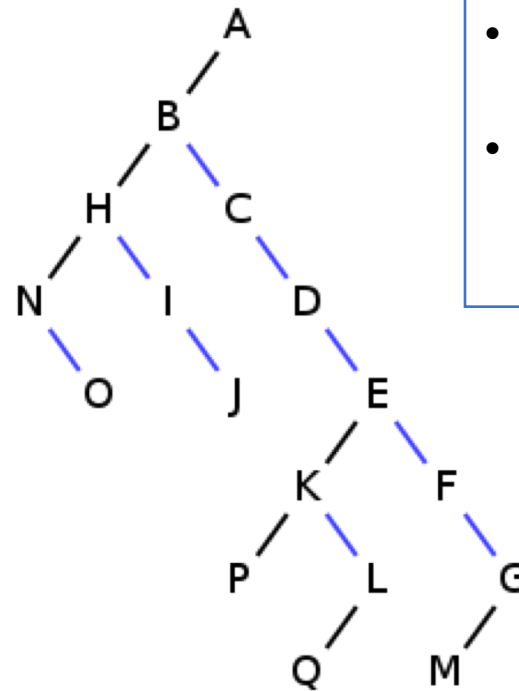
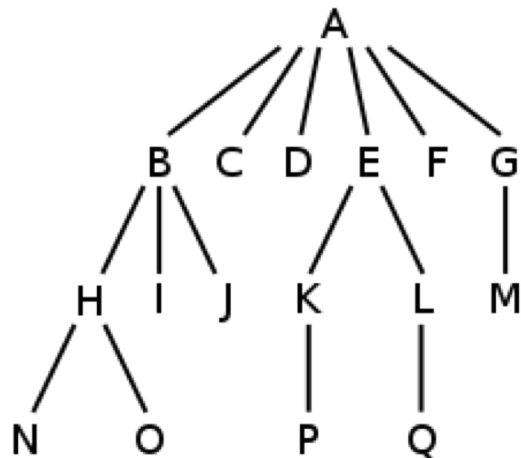
EXTRACT-MIN	$\Theta(\lg n)$
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UNION	$\Theta(n)$
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DECREASE-KEY	$\Theta(\lg n)$
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DELETE	$\Theta(\lg n)$
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# small digression: ordered trees



ordered tree:

- tree has designated root
- a node can have any number of children
- if a node has  $k$  children, they are ordered
  - 1<sup>st</sup> child, 2<sup>nd</sup> child, ...,  $k^{\text{th}}$  child
- good representation involves two pointers per node:
  - first- child and next-sibling
  - so the children of a node are in a linked list