Algorithms and Data Structures	
CMPSC 465	<u></u>
Priority Queues and	
Binary Heaps	
Paul Medvedev	
based on slides by S. Raskhodnikova , A. Smith, K. Wayne, C. Leiserson and E. Demaine.	
Priority Queue Abstract Data Type	
Dynamic set of pairs (key, data), called elementsSupports operations:	
 MakeNewPQ() Insert(S,x) where S is a PQ and x is a (key,data) pair Extract-Max(S) removes and returns the element with the highest 	
 key value (or one of them if several have the same value) Example: managing jobs on a processor, want to execute job in queue with the highest priority 	
 Can also get a "min" version, that supports Extract-Min instead of Extract-Max 	
 Sometimes support additional operations like Delete, Increase-Key, Decrease-Key, etc. 	
2	
Rooted trees	
 Rooted Tree: collection of nodes and edges Edges go down from root 	
(from parents to children)No two paths to the same nodeSometimes, children have "names"	
(e.g. left, right, middle, etc)	

Heaps: Tree Structure	
 Data Structure that implements Priority Queue Conceptually: binary tree 	· -
In memory: (often) stored in an arrayMax-Heap property:	
For every node other than root, $key[Parent(i)] \ge key[i]$	
 Recall: complete binary tree all leaves at the same level, and 	
> every internal node has exactly 2 children	
 Heaps are nearly complete binary trees Every level except possibly the bottom one is full 	
> Bottom layer is filled left to right	
4	
п. 17	
Height	
 Heap Height = length of longest simple path from root to some leaf 	
> e.g. a one-node heap has height 0,	
a two- or three-node heap has height 1, • Exercises:	
What is are max. and min. number of elements in a	
heap of height h? • ans: min = 2 ^h ,	
$\max = 2^{h+1} - 1$	
What is height as a function of number of nodes n?• ans: floor(log(n))	-
5	
Array representation	
Instead of dynamically allocated tree, heaps often represented in a fixed-size array	
 smaller constants, works well in hardware. Idea: store elements of tree layer by layer, top to 	
bottom, left to right	
 Navigate tree by calculating positions of neighboring nodes: 	-
▶ Left(i) := 2i▶ Right(i) := 2i+1	
> Parent(i) := floor(i/2)	

• Example: [20 15 8 10 7 5 6]

2

Review Questions Is the following a valid max-heap? > 20 10 4 9 6 3 2 8 7 5 12 1 > (If not, repair it to make it valid) Is an array sorted in decreasing order a valid max-heap? Two important "local repair operations": **Heapify "Down" Two important "local repair operations": **Heapify "Down" **Heapify "Dow" **Jenapify "Up" **Suppose we start from a valid heap and decrease key of node i, so is it is utilisatel than parent **the two subtrees rooted at i remain valid **How do we tracrange nodes to make the heap valid again? **Ide: let now, smaller key "sint" to correct position **Find index with largest key among (i, Left(i), Right(i)) **If 1: largest, EXCHANGE i with largest and recurse on largest **Suppose the largest in the large		
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h. Then it holds for troop of height h		

Priority Queue: Extract-Max		
 This gives us our first PQ operation: Extract-Max(A) tmp := A[1] A[1] := A[heap-size] heap-size := heap-size-1 MAX-HEAPIFY-DOWN(A,1) return tmp 		
	10	
Local Repair: Heapify "Up"		
 Two important "local repair operations" Heapify "Down" Heapify "Up" 		
• Suppose we start from a valid heap and increase key of node <i>i</i> , so > it is still larger than both children, but		
 might be larger than parent How to rearrange nodes to make heap valid again? Idea: let new, larger key "float" up to right position 		
If A[i] > A[Parent(i)], EXCHANGE i with parent and recurse on parent Pseudocode in CLRS Chap 6.5: "Heap-Increase-Key"		
	11	
Local Repair: Heapify "Up"		
• Exercise: what does Max-Heapify-Up do on the following input? > 20 10 4 9 6 3 2 8 7 21 0 1		
 Running time: O(log n) tight in worst case 		
Correctness: by induction on height		
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Priority Queue: Insert operation		
 This gives us our second PQ operation: Insert(A,x) A[heap-size+1] := x heap-size := heap-size+1 MAX-HEAPIFY-UP(A,heap-size) 	13	
Other PQ operations		
 Max(S): return max element without extracting it Increase-Key(S,i,new-key) Decrease-Key(S,i,new-key) Delete(S,i) > Delete the element in position i > Move the last element to position i. If the new key at position i is smaller than the old key, then call Decrease-Key at position i. If its larger, then call Increase-Key. Otherwise, do nothing. A PQ contains (key, data) pairs. The data is stored separate from the heap. But, we keep an auxiliary array of pointers together with the heap array. These pointers point from each key to its corresponding data. 	14	
Heap Sort		
 Heaps give an easy O(n log n) sorting algorithm: For i = 2 to n Insert(Q,A[i]) For i = n downto 2 A[i] := Extract-Max(Q) There is a faster way (O(n) time) to build a heap from an unserted errory 	_	
from an unsorted array.		
1	15	