Algorithms and Data Structures

(c) Marcin Sydow

Priority Queue

Example Applications

Extensions Priority Queue

Binomia Heap

Summary

### Algorithms and Data Structures Priority Queue

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## Topics covered by this lecture:

Algorithms and Data Structures

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Priority Queue

Example Applications

Extensions of Priority Queue

Bin omia Heap

Summary

Priority Queue

Naive Implementations

- Binary Heap
- HeapSort and other examples

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- Extended Priority Queues
- (\*) Binomial Heap

# Priority Queue Definition

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#### Priority Queue

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Summary

Priority Queue (PQ) is an abstract data structure supporting the following operations:

- insert(T e) // add to PQ a new element with assigned priority
- T findMin() // return the element with minimum priority
- T delMin() // return and delete the elt. with min. prior.

(optional operation: construct(sequence $\langle T \rangle$  s) // create a PQ given set of elements)

```
Each element has associated "priority".
```

One can also consider a "max"-type priority queue, defined analogously

Note: priority queue is not a "specialised" queue (why? hint: remember the definition of queue)

### Implementations of Priority Queue

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#### Priority Queue

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Summary

The implementations evolve, for example:

- "naive" (as an array or list)
- Binary Heap (1964 Williams; Floyd 1964)
- Binomial Heap (1978 Vuillemin)
- Pairing Heap\* (1986 Fredman, Sedgewick, Sleator, Tarjan; 2000 Iacono; Pettie 2005)

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- Fibonacci Heap\* (1987 Fredman, Tarjan)
- "Thin" Heaps and "Fat" Heaps\* (1999 Kaplan, Tarjan)
- \* not in this lecture

### Naive implementations

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#### Priority Queue

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Summary

# unsorted sequence: insert: O(1), deleteMin: O(n), construct: O(n)

sorted sequence:

insert: O(n), deleteMin: O(1): construct: O(n log(n))

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(sequence can be an array or linked list)

# Binary Heap

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Summary

Binary Heap is a  $complete^1$  binary tree satisfying the following "heap-order condition" (for each (non-root) node x):

(priority of parent[x])  $\leq$  (priority of x)

Observations:

- minimum priority is at root
- priorities on each path from the root to a leaf form a non-decreasing sequence
- height of n-element binary heap is Θ(log(n)) (due to completeness)

(there is also a "max" variant of the above definition)

## Array Representation of Binary Heap

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#### Priority Queue

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Summary

Due to the fact that it is a **complete** binary tree, Binary Heap can be compactly represented as an array:

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### Navigation:

(assume the root is under index 1)

- parent[i] == i/2 (for non-root i)
- *i.left* == 2i, *i.right* == 2i + 1 (for non-leaf i)

## Restoring the Heap Order

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Summary

Two helper, internal operations.

Both assume the heap order is correct except the position i:

- upheap(i) (call when (key of parent[i] > key of i), assert: heap ok below i): the key under i goes up until ok
- downheap(i) (call when one of children of i has lower key than i, assert: heap ok above i and for both its subtrees): the key under i goes down until ok

Both operations use O(log(n)) key comparisons (n - number of elements)

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# Upheap

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#### Priority Queue

Example Applications

```
Extensions o
Priority
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```

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Summary

### Example of upheap(i) implementation:

```
upheap(i) // i > 0, heap ok under i
key = heap[i]
parent = i/2
while((parent > 0) && (heap[parent] > key))
heap[i] = heap[parent]
i = parent
parent /= 2
heap[i] = key
```

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### Downheap

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Example of downheap(i) implementation:

```
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```

#### Priority Queue

Example Application:

```
Extensions o
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```

```
Binomial
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```

Summary

Remarks: recursion used here only for keeping the code short, swapping too. Both can be avoided to make the implementation more efficient.

# Priority Queue implemented on Binary Heap

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#### Priority Queue

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Summary

(data size: number of elements (n), dom. oper.: comparison of priorities)

- insert(x): add x to the bottom and upheap(bottom)
   (O(log(n)))
- findMin(): return root (O(1))
- delMin(): move the bottom element to the root and downheap(root) (O(log(n)))

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What is the complexity of construct?

# Priority Queue implemented on Binary Heap

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Summary

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- delMin(): move the bottom element to the root and downheap(root) (O(log(n)))

What is the complexity of construct?

Interestingly, construct has fast,  $\Theta(n)$  implementation.

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### Complexity of construct

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#### Priority Queue

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Summary

```
(naive: n \times insert (which gives \Theta(nlog(n))))
faster way:
```

for(i = n/2; i > 0; i--) downHeap(i)

Analysis: downHeap is called at most  $2^d$  times for nodes of depth d, each such call costs O(h - d) (where h is the height of heap). Thus, the total cost is:

$$O(\sum_{0 \le d < h} 2^d (h - d)) = O(2^h \sum_{0 \le d < h} \frac{h - d}{2^{h - d}}) = O(2^h \sum_{j \ge 1} \frac{j}{2^j}) = O(n)$$

(the last equation holds because:  $\sum_{i\geq 1} i2^{-i} = 2$ )

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$$\sum_{i\geq 1} i2^{-i} = 2$$
: a proof

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Summary

infinite geometric series:  

$$\sum_{i\geq 0} q^i = \lim_{n\to\infty} \frac{1-q^n}{1-q} = \frac{1}{1-q} \text{ for } 0 \leq q < 1$$
Thus:  

$$\sum_{i\geq 0} 2^{-i} = 1 + 1/2 + 1/4 + \dots = 2 \text{ (a geometric series with } q = 1/2)$$
Now:<sup>2</sup>

finite geometric series:  $\sum_{i=0}^{n-1} q^i = \frac{1-q^n}{1-q}$  for  $q \neq 1$ 

$$\sum_{i\geq 1} i2^{-i} = \sum_{i\geq 1} 2^{-i} + \sum_{i\geq 2} 2^{-i} + \sum_{i\geq 3} 2^{-i} + \dots = (1+1/2+1/4+\dots) = 2$$

(the first equality is due to the re-grouping of terms  $(2^{-i}$  occurs in exactly *i* first sums))

<sup>2</sup>More generally,  $\sum_{k\geq 0} kx^k = \frac{x}{(1-x)^2}$ , for any |x| < 1 (take derivative of infinite geometric series to obtain it)

## Example: HeapSort

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Summary

How to sort a sequence s with a Priority Queue?

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## Example: HeapSort

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Summary

How to sort a sequence s with a Priority Queue? (pq is an object representing priority queue)

```
while(s.hasNext())
pq.insert(s.next())
```

```
while(!pq.isEmpty())
    result.add(pq.delMin())
```

data size: # elements (n), dom. op.: comparison time complexity:  $\Theta(nlog(n))$ , space complexity:  $\Theta(n)$ 

Notice: if we put the min element to the last released place in the array, we obtain O(1) space complexity!

# Other examples of applications of priority queues

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Priority Queue

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Summary

Priority queues are typically used in *greedy* algorithms (for selecting a next element in the solution in the efficient way), for example:

- Huffman Code computation
- Dijkstra's shortest-path algorithm (on other lecture)
- Prim's minimum spanning tree algorithm (on other lecture)

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etc.

## Extensions of Priority Queue

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Summary

Addressable Priority Queue

- construct(sequence<T> s)
- H insert(T e) // as before but returns a handle to the inserted element

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- T findMin()
- T delMin()
- decreaseKey(H pointer, T newPriority)
- delete (H pointer)

In addition: Mergeable Priority Queue:

merge(PQ priorityQueue1, PQ priorityQueue2)

### Complexities of Priority Queue Operations

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Priority Queue

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Binomial Heap

Summary

| operation                                      | unsort. | sort. | binary heap | binomial heap |  |  |  |
|--|---------|-------|-------------|---------------|--|--|--|
| insert   | 1       | n     | lg n        | lg n          |  |  |  |
| findMin  | n       | 1     | 1           | lg n          |  |  |  |
| delMin   | n       | 1     | lg n        | lg n          |  |  |  |
| decreaseKey                                    | 1       | n     | lg n        | lg n          |  |  |  |
| delete   | 1       | n     | lg n        | lg n          |  |  |  |
| merge  | 1       | n     | n           | lg n          |  |  |  |
| (the entries have implicit $O(.)$ around them) |         |       |             |               |  |  |  |

*Binomial Heap*: a bit more advanced implementation of priority queue that supports fast merge (and keeps other operations fast)

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### **Binomial Trees**

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Priority Queue

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Binomial Heap

Summary

A *binomial tree*  $B_i$  of degree *i* is a rooted tree defined recursively as follows:

- $B_0$  consists of a single node
- **B**<sub>i</sub>: the root has i sons:  $B_{i-1}, B_{i-2}, ..., B_0$  (in such order)

### Properties of $B_i$ :

- height: i
- has exactly  $\binom{i}{j}$  (binomial coefficient) nodes at level j
- has exactly 2<sup>i</sup> nodes in total
- can be obtained by adding a B<sub>i-1</sub> as a left-most son of a root of a B<sub>i-1</sub>

(Notice the analogies with the properties of binomial coefficients!)

## **Binomial Heap**

#### Algorithms and Data Structures

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Binomial Heap

Summary

Binomial Heap is a list of binomial trees sorted decreasingly by degrees (from left to right), where each binomial tree satisfies the *heap order*.

Properties of a n-element binomial heap:

- it consists of *O*(*logn*) binomial trees
- B<sub>i</sub> is its part only if the i th bit in the binary representation of n is set to 1

(both properties are implied by the fact that  $|B_i| == 2^i$  and properties of binary representation of numbers)

### Operations on Binomial Heap

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Summary

- findMin: min is among the O(logn) roots
- merge: similar to adding two binary numbers. Summing two 'ones' on position i: merging two binomial trees B<sub>i</sub> to obtain one B<sub>i+1</sub> (remind the last property of binomial trees). The tree with lower key becomes the root, the other becomes its right-most son. The summing goes through both lists of binomial trees from left to right (thus it has O(logn) complexity)
- insert: merge with a 1-element binomial heap (O(logn))
- delMin: find the root with the lowest key (O(logn)), cut it out, merge the list of its sons (being a correct binomial heap itself!) with the rest of the remaining part (O(logn))

decreaseKey: similarly as in binary heap (O(logn))

delete: move it to the root, cut, then as in delMin
(O(logn))

# Questions/Problems:

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Summary

Definition of Priority Queue

- Complexities on naive implementation (list, array)
- Binary Heap definition
- Binary Heap represented as Array
- Priority Queue operations on Binary Heap (+ complexities)

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- HeapSort and other examples of applications
- Extended Priority Queues (operations)
- (\*) Binomial Trees and Binomial Heap
- (\*) Priority Queue implemented on Binomial Heap (operations + complexities)

| Algorithms |     |    |    |      |  |  |  |  |
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Summary

Thank you for your attention

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