

CSE 326: Data Structures

Priority Queues – Binary Heaps

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Lectures 3 & 4

4/5/2007

1

Outline

- Admin (proj #1)
- Math/Big-O – short summary
- Priority Queues (Binary Min Heaps)
 - Reading: Weiss, Ch. 6

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2

Project #1 Turn-in

- The turnin page for project 1 is now linked to the project page.
- Turn in your **electronic documents** before **midnight** on Wednesday.
- Turn in **hardcopies** in sections on Thursday (whichever section you normally attend).

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3

Simplifying Recurrences

Given a recursive equation for the running time, can sometimes simplify it for analysis.

- For an **upper-bound** analysis, can optionally simplify to something **larger**, e.g.

$$T(n) = T(\text{floor}(n/2)) + 1 \quad \text{to} \quad T(n) \leq T(n/2) + 1$$

- For a **lower-bound** analysis, can optionally simplify to something **smaller**, e.g.

$$T(n) = 2T(n/2 + 5) + 1 \quad \text{to} \quad T(n) \geq 2T(n/2) + 1$$

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4

The One Page Cheat Sheet

- **Calculating series:**

e.g.
$$\sum_{i=1}^n i = \frac{n(n+1)}{2}$$

1. Brute force (Section 1.2.3)
2. Induction (Section 1.2.5)
3. Memorize simple ones!

- **Solving recurrences:**

e.g. $T(n) = T(n/2) + 1$

1. Expansion (example in class)
2. Induction (Section 1.2.5)
3. Telescoping (later...)

- **General proofs (Section 1.2.5)**

e.g. *How many edges in a tree with n nodes?*

1. Counterexample
2. Induction
3. Contradiction

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5

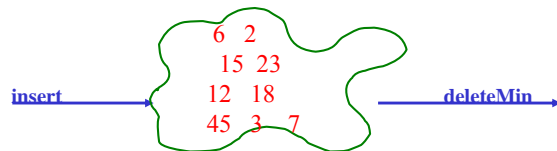
Processor Scheduling

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6

Priority Queue ADT

- Checkout line at the supermarket ???
- Printer queues ???
- operations: insert, deleteMin



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7

Priority Queue ADT

1. **PQueue data** : collection of data with **priority**
2. **PQueue operations**
 - insert
 - deleteMin(also: create, destroy, is_empty)
3. **PQueue property**: for two elements in the queue, x and y , if x has a **lower** priority value than y , x will be deleted before y

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8

Applications of the Priority Q

- Select print jobs in order of decreasing **length**
- Forward packets on network routers in order of **urgency**
- Select most **frequent** symbols for compression
- Sort numbers, picking **minimum** first
- **Anything greedy**

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9

Implementations of Priority Queue ADT

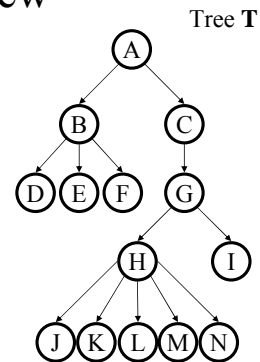
	insert	deleteMin
Unsorted list (Array)		
Unsorted list (Linked-List)		
Sorted list (Array)		
Sorted list (Linked-List)		
Binary Search Tree (BST)		

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10

Tree Review

- root(T):*
- leaves(T):*
- children(B):*
- parent(H):*
- siblings(E):*
- ancestors(F):*
- descendants(G):*
- subtree(C):*

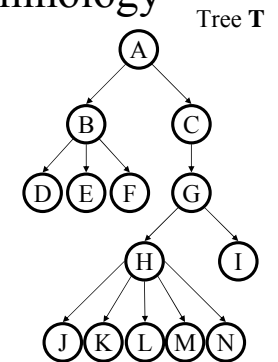


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11

More Tree Terminology

- depth(T):*
- height(G):*
- degree(B):*
- branching factor(T):*



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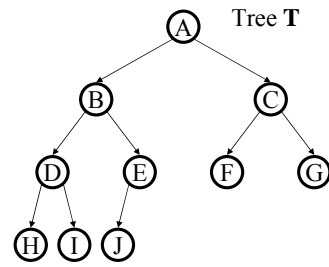
12

Some More Tree Terminology

T is *binary* if ...

T is *n-ary* if ...

T is *complete* if ...



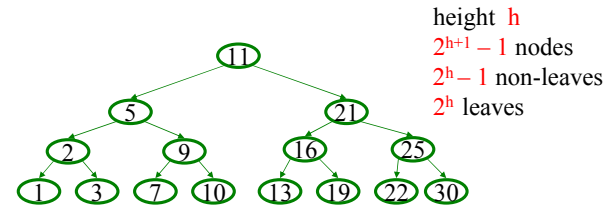
How deep is a complete tree with n nodes?

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13

Brief interlude: Some Definitions:

A **Perfect** binary tree – A binary tree with all leaf nodes at the same depth. All internal nodes have 2 children.



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14

Full Binary Tree

- A binary tree in which each node has ***exactly zero or two children***.
- (also known as a proper binary tree)
- (we will use this later for Huffman trees)

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15

Binary Heap Properties

1. Structure Property
2. Ordering Property

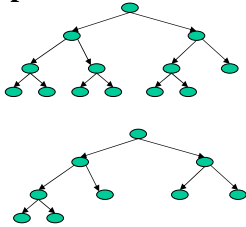
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16

Heap Structure Property

- A binary heap is a complete binary tree.
- Complete binary tree – binary tree that is completely filled, with the possible exception of the bottom level, which is filled left to right.

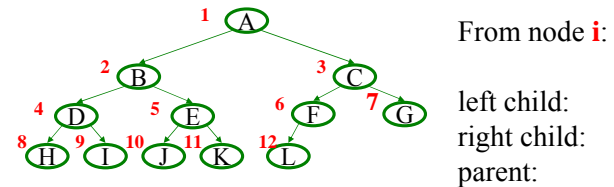
Examples:



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17

Representing Complete Binary Trees in an Array



implicit (array) implementation:

	A	B	C	D	E	F	G	H	I	J	K	L	
0	1	2	3	4	5	6	7	8	9	10	11	12	13

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18

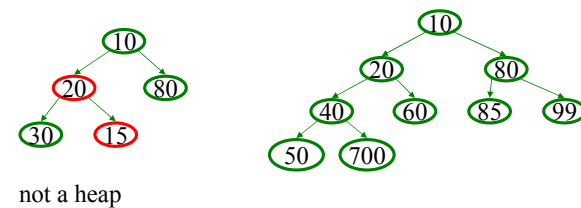
Why better than tree with pointers?

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19

Heap Order Property

Heap order property: For every non-root node X, the value in the parent of X is less than (or equal to) the value in X.

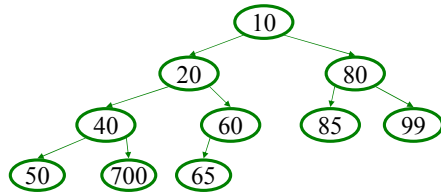


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20

Heap Operations

- findMin:
- insert(val): percolate up.
- deleteMin: percolate down.



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21

Heap – Insert(val)

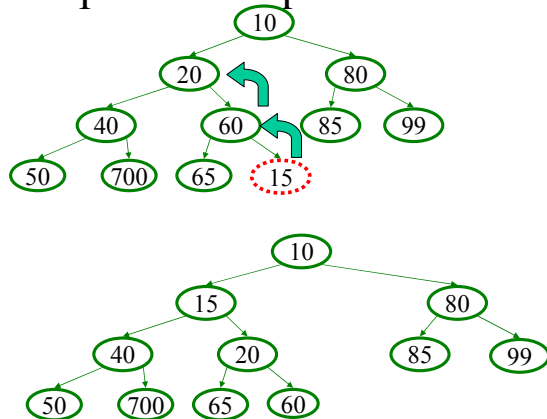
Basic Idea:

1. Put val at “next” leaf position
2. Repeatedly exchange node with its parent if needed

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22

Insert: percolate up



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23

Insert pseudo/C++ Code (optimized)

```

void insert(Object o) {
    assert(!isFull());
    size++;
    newPos =
        percolateUp(size, o);
    Heap[newPos] = o;
}

int percolateUp(int hole,
                Object val) {
    while (hole > 1 &&
           val < Heap[hole/2])
        Heap[hole] = Heap[hole/2];
        hole /= 2;
    return hole;
}
  
```

runtime:

(Java code in book)

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24

Heap – Deletemin

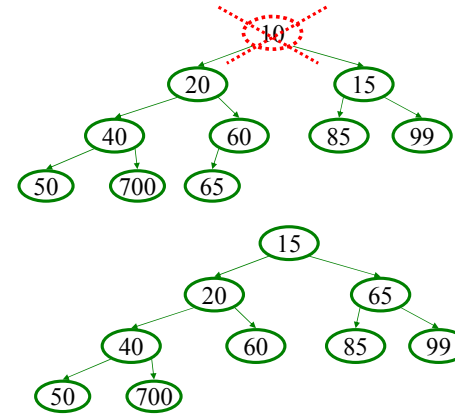
Basic Idea:

1. Remove root (that is always the min!)
2. Put “last” leaf node at root
3. Find smallest child of node
4. Swap node with its smallest child if needed.
5. Repeat steps 3 & 4 until no swaps needed.

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25

DeleteMin: percolate down



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26

DeleteMin pseudo/C++ Code (Optimized)

```

Object deleteMin() {
    assert(!isEmpty());
    returnVal = Heap[1];
    size--;
    newPos =
        percolateDown(1,
            Heap[size+1]);
    Heap[newPos] =
        Heap[size + 1];
    return returnVal;
}

int percolateDown(int hole,
    Object val) {
    while (2*hole <= size) {
        left = 2*hole;
        right = left + 1;
        if (right <= size &&
            Heap[right] < Heap[left])
            target = right;
        else
            target = left;

        if (Heap[target] < val) {
            Heap[hole] = Heap[target];
            hole = target;
        }
        else
            break;
    }
    return hole;
}
    
```

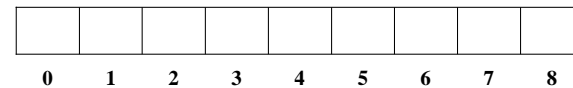
runtime:

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(Java code in book)

27

Insert: 16, 32, 4, 69, 105, 43, 2



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28

More Priority Queue Operations

- **decreaseKey**

– given a pointer to an object in the queue, reduce its priority value

Solution: change priority and _____

- **increaseKey**

– given a pointer to an object in the queue, increase its priority value

Solution: change priority and _____

Why do we need a pointer? Why not simply data value?

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29

More Heap Operations

decreaseKey(objPtr, amount): raise the priority of a object, percolate up

increaseKey(objPtr, amount): lower the priority of a object, percolate down

remove(objPtr): remove a object, move to top, them delete.
 1) decreaseKey(objPtr, ∞)
 2) deleteMin()

Worst case Running time for all of these:

FindMax?

ExpandHeap – when heap fills, copy into new space.

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30

More Priority Queue Operations

- **Remove(objPtr)**

– given a pointer to an object in the queue, remove it

Solution: set priority to negative infinity, percolate up to root and deleteMin

- **buildHeap**

Naïve solution:

Running time:

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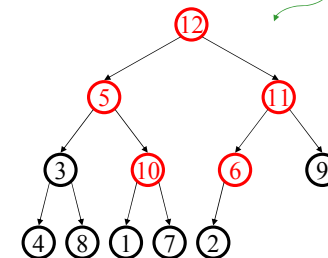
Can we do better?

31

BuildHeap: Floyd's Method

12	5	11	3	10	6	9	4	8	1	7	2
----	---	----	---	----	---	---	---	---	---	---	---

Add elements arbitrarily to form a complete tree.
 Pretend it's a heap and fix the heap-order property!



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32

Buildheap pseudocode

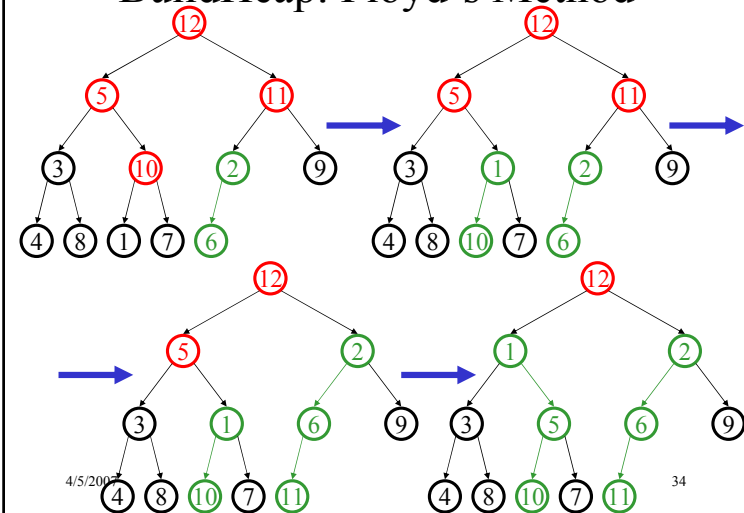
```
private void buildHeap() {
    for ( int i = currentSize/2; i > 0; i-- )
        percolateDown( i );
}
```

runtime:

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33

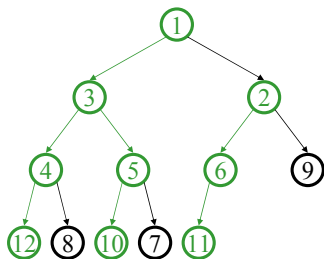
BuildHeap: Floyd's Method



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34

Finally...



runtime:

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35

Facts about Heaps

Observations:

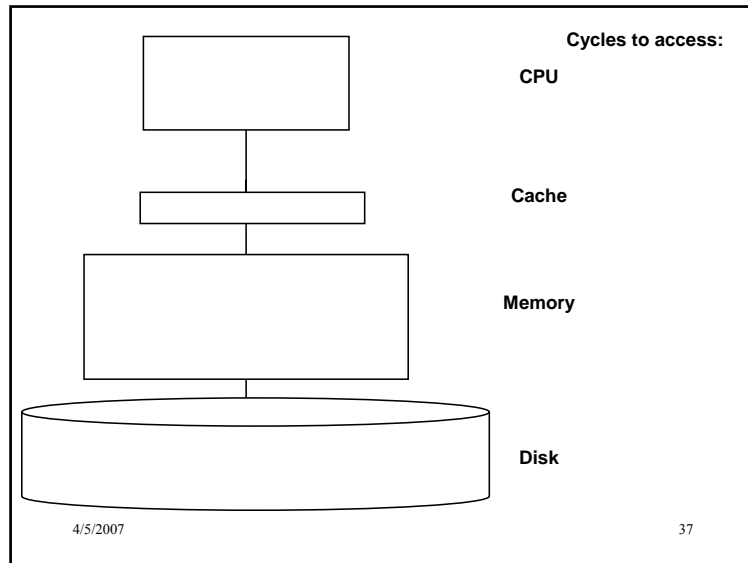
- finding a child/parent index is a multiply/divide by two
- operations jump widely through the heap
- each percolate step looks at only two new nodes
- inserts are at least as common as deleteMins

Realities:

- division/multiplication by powers of two are equally fast
- looking at only two new pieces of data: bad for cache!
- with huge data sets, disk accesses dominate

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36



A Solution: d -Heaps

- Each node has d children
- Still representable by array
- Good choices for d :
 - (choose a power of two for efficiency)
 - fit one set of children in a cache line
 - fit one set of children on a memory page/disk block

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Operations on d -Heap

- Insert : runtime =
- deleteMin: runtime =

Does this help insert or deleteMin more?

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One More Operation

- Merge two heaps. Ideas?

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