

Binary Heaps

CSE 373
Data Structures & Algorithms
Linda Shapiro
Spring 2013

Today's Outline

- **Announcements**
 - › Assignment #3 is due May 1 at 11:00pm.
- **Today's Topics:**
 - › **Binary Heaps (Weiss Ch. 6: 6.1-6.3)**

4/26/13

Binary Heaps

2

Revisiting FindMin

- Application: Find the **smallest** (or highest priority) item quickly
 - › **Operating system** needs to schedule jobs according to priority instead of FIFO
 - › **Event simulation** (bank customers arriving and departing, ordered according to when the event happened)
 - › **Find** student with highest grade, employee with highest salary etc.

4/26/13

Binary Heaps

3

Priority Queue ADT

- Priority Queue can efficiently do:
 - › FindMin (and DeleteMin)
 - › Insert
- What if we use...
 - › **Lists**: If sorted, what is the run time for Insert and FindMin? Unsorted?
 - › **Binary Search Trees**: What is the run time for Insert and FindMin?
 - › **Hash Tables**: What is the run time for Insert and FindMin?

4/26/13

Binary Heaps

4

Less flexibility → More speed

- **Lists**
 - › If sorted: FindMin is $O(1)$ but Insert is $O(N)$
 - › If not sorted: Insert is $O(1)$ but FindMin is $O(N)$
- **Balanced Binary Search Trees (BSTs)**
 - › Insert is $O(\log N)$ and FindMin is $O(\log N)$
- **Hash Tables**
 - › Insert $O(1)$ but no hope for FindMin
- **BSTs look good but...**
 - › **BSTs are efficient for all Finds, not just FindMin**
 - › **We only need FindMin**

4/26/13

Binary Heaps

5

Better than a speeding BST

- We can do better than Balanced Binary Search Trees?
 - › **Very limited requirements: Insert, FindMin, DeleteMin.** The goals are:
 - › **FindMin is $O(1)$**
 - › Insert is $O(\log N)$
 - › DeleteMin is $O(\log N)$

4/26/13

Binary Heaps

6

Binary Heaps

- A binary heap is a binary tree (NOT a BST) that is:
 - Complete: the tree is completely filled except possibly the bottom level, which is filled from left to right
 - Satisfies the **heap order property**
 - every node is less than or equal to its children
 - or every node is greater than or equal to its children
- The root node is always the smallest node
 - or the largest, depending on the heap order

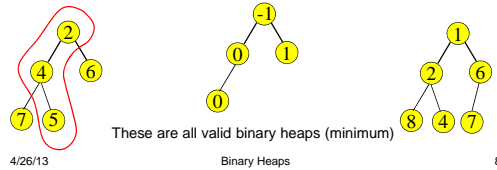
4/26/13

Binary Heaps

7

Heap order property

- A heap provides limited ordering information
- Each *path* is sorted, but the subtrees are not sorted relative to each other
 - A binary heap is NOT a binary search tree



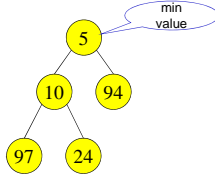
4/26/13

Binary Heaps

8

Binary Heap vs Binary Search Tree

Binary Heap



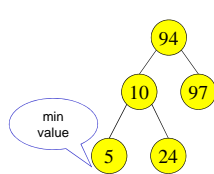
Parent is less than both left and right children

4/26/13

Binary Heaps

9

Binary Search Tree



Parent is greater than left child, less than right child

Structure property

- A binary heap is a complete tree
 - All nodes are in use except for possibly the right end of the bottom row



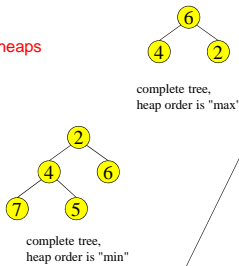
4/26/13

Binary Heaps

10

Examples

heaps

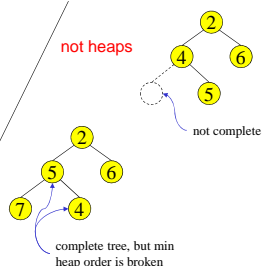


4/26/13

Binary Heaps

11

not heaps



How to Implement

- Heaps are not linked structures.
- They are stored in arrays.
- They are *extremely* efficient, both in time and in space.

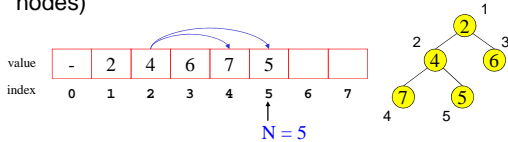
4/26/13

Binary Heaps

12

Array Implementation of Heaps (Implicit Pointers)

- Root node = $A[1]$
- Children of $A[i] = A[2i], A[2i + 1]$
- Parent of $A[j] = A[j/2]$
- Keep track of current size N (number of nodes)



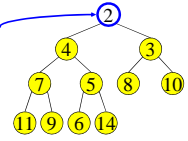
4/26/13

Binary Heaps

13

FindMin and DeleteMin

- FindMin: Easy!
 - › Return root value $A[1]$
 - › Run time = ?



- DeleteMin:
 - › Delete (and return) value at root node

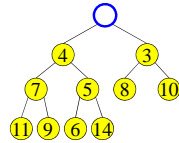
4/26/13

Binary Heaps

14

DeleteMin

- Delete (and return) value at root node



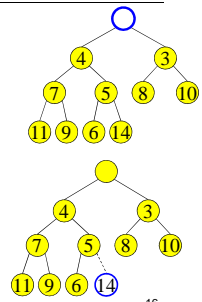
4/26/13

Binary Heaps

15

Maintain the Structure Property

- We now have a "Hole" at the root
 - › Need to fill the hole with another value
- When we get done, the tree will have one less node and must still be complete



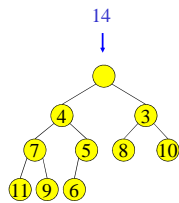
4/26/13

Binary Heaps

16

Maintain the Heap Property

- The last value has lost its node
 - › we need to find a new place for it
- We can do a simple insertion sort operation to find the correct place for it in the tree

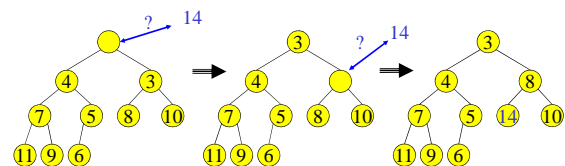


4/26/13

Binary Heaps

17

DeleteMin: Percolate Down



- Keep comparing with children $A[2i]$ and $A[2i + 1]$
- Copy smaller child up and go down one level
- Done if both children are \geq item or reached a leaf node
- What is the run time?

4/26/13

Binary Heaps

18

1 2 3 4 5 6
~~8~~ | 10 | 8 | 13 | 14 | 25

Percolate Down

```

PercDown(i:integer, x: integer): {
  // N is the number elements, i is the hole,
  // x is the value to insert
  Case{
    no children 2i > N : A[i] := x; //at bottom//
    one child   2i = N : if A[2i] < x then
      at the end   A[i] := A[2i]; A[2i] := x;
                  else A[i] := x;
    2 children  2i < N : if A[2i] < A[2i+1] then j := 2i;
                        else j := 2i+1;
                        if A[j] < x then
                          A[i] := A[j]; PercDown(j,x);
                        else A[i] := x;
  }}
  
```

4/26/13 Binary Heaps 19

Bigger Example Shown Pictorially in Text

1	2	3	4	5	6	7	8	9	10	11
13	14	16	19	21	19	68	65	26	32	31

deleteMin deletes the root (13), so the 31 is the input To Percolate Down, and N becomes 10 instead of 11.1,

PercDown(1,31)

Student Exercise

4/26/13 Binary Heaps 20

DeleteMin: Run Time Analysis

- Run time is $O(\text{depth of heap})$
- A heap is a complete binary tree
- Depth of a complete binary tree of N nodes?
 - › $\text{depth} = \lfloor \log_2(N) \rfloor$
- Run time of DeleteMin is $O(\log N)$

4/26/13 Binary Heaps 21

Insert

- Add a value to the tree
- Structure and heap order properties must still be correct when we are done

4/26/13 Binary Heaps 22

Maintain the Structure Property

- The only valid place for a new node in a complete tree is at the end of the array
- We need to decide on the correct value for the new node, and adjust the heap accordingly

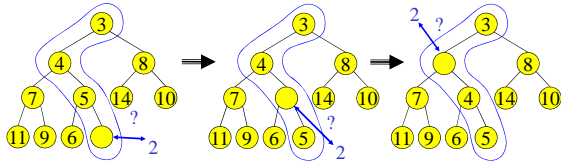
4/26/13 Binary Heaps 23

Maintain the Heap Property

- The new value goes where?
- We can do a simple insertion sort operation to find the correct place for it in the tree

4/26/13 Binary Heaps 24

Insert: Percolate Up



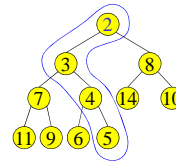
- Start at last node and keep comparing with parent $A[i/2]$
- If parent larger, copy parent down and go up one level
- Done if parent \leq item or reached top node $A[1]$

4/26/13

Binary Heaps

25

Insert: Done



- Run time?

4/26/13

Binary Heaps

26

PercUp

- Define PercUp which percolates new entry to correct spot.
- Note: the parent of i is $i/2$

```
PercUp(i : integer, x : integer): {
  ???
}
```

4/26/13

Binary Heaps

27

PercUp Solution

```
PercUp(i : integer, x : integer): {
  if i = 1 then A[1] := x
  else if A[i/2] < x then
    A[i] := x;
  else
    A[i] := A[i/2];
    Percup(i/2, x);
}
```

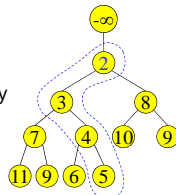
4/26/13

Binary Heaps

28

Sentinel Values

- Every iteration of Insert needs to test:
 - › if it has reached the top node $A[1]$
 - › if parent \leq item
- Can avoid first test if $A[0]$ contains a very large negative value
 - › sentinel $-\infty <$ item, for all items
- Second test alone always stops at top



value	$-\infty$	2	3	8	7	4	10	9	11	9	6	5		
index	0	1	2	3	4	5	6	7	8	9	10	11	12	13

4/26/13

Binary Heaps

29

Binary Heap Analysis

- Space needed for heap of N nodes: $O(\text{MaxN})$
 - › An array of size MaxN , plus a variable to store the size N , plus an array slot to hold the sentinel
- Time
 - › FindMin: $O(1)$
 - › DeleteMin and Insert: $O(\log N)$
 - › BuildHeap from N inputs : $O(N)$ How is this possible?

4/26/13

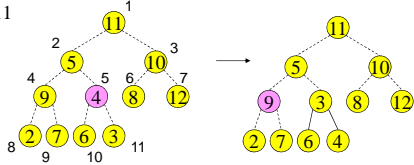
Binary Heaps

30

Build Heap from any unsorted array

```
BuildHeap {
  for i = N/2 to 1 by -1 PercDown(i, A[i])
}
```

N=11

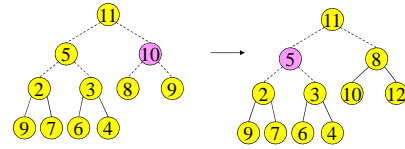


4/26/13

Binary Heaps

31

Build Heap

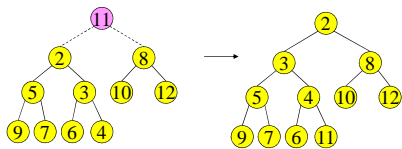


4/26/13

Binary Heaps

32

Build Heap



4/26/13

Binary Heaps

33

Analysis of Build Heap

- Assume $N = 2^k - 1$
 - Level 1: $k - 1$ steps for 1 item
 - Level 2: $k - 2$ steps for 2 items
 - Level 3: $k - 3$ steps for 4 items
 - Level i : $k - i$ steps for 2^{i-1} items

$$\begin{aligned} \text{Total Steps} &= \sum_{i=1}^{k-1} (k-i)2^{i-1} = 2^k - k - 1 \\ &= O(N) \end{aligned}$$

4/26/13

Binary Heaps

34

Other Heap Operations

- Find(X, H):** Find the element X in heap H of N elements
 - What is the running time? $O(N)$
- FindMax(H):** Find the maximum element in H
 - Where FindMin is $O(1)$
 - What is the running time? $O(N)$
- We sacrificed performance of these operations in order to get $O(1)$ performance for FindMin**

4/26/13

Binary Heaps

35

Other Heap Operations

- DecreaseKey(P, Δ, H):** Decrease the key value of node at position P by a positive amount Δ, e.g., to increase priority
 - First, subtract Δ from current value at P
 - Heap order property may be violated
 - so percolate up to fix
 - Running Time: $O(\log N)$

4/26/13

Binary Heaps

36

Other Heap Operations

- IncreaseKey(P,Δ,H): Increase the key value of node at position P by a positive amount Δ, e.g., to decrease priority
 - › First, add Δ to current value at P
 - › Heap order property may be violated
 - › so percolate down to fix
 - › Running Time: O(log N)

4/26/13

Binary Heaps

37

Other Heap Operations

- Delete(P,H): E.g. Delete a job waiting in queue that has been preemptively terminated by user
 - › Use DecreaseKey(P,∞,H) followed by DeleteMin
 - › Running Time: O(log N)

4/26/13

Binary Heaps

38

Other Heap Operations

- Merge(H1,H2): Merge two heaps H1 and H2 of size O(N). H1 and H2 are stored in two arrays.
 - › Can do O(N) Insert operations: O(N log N) time
 - › Better: Copy H2 at the end of H1 and use BuildHeap. Running Time: O(N)

4/26/13

Binary Heaps

39

Priority Queues in AI

- The A* algorithm is the classic heuristic search algorithm in Artificial Intelligence.
- Use of a priority queue is key to this algorithm so that the state with the minimum distance to a goal state can be quickly found and removed from the queue.
- The heap is a good data structure for this task.

4/26/13

Binary Heaps

40