

CS 361
Data Structures & Algs
Lecture 9

Prof. Tom Hayes
University of New Mexico
09-21-2010

Today

Orderings

Searching

Sorting

Priority Queues & Heaps

Order Relation

We say a binary relation R is an “order relation” if it is

(1) transitive $a R b$ and $b R c$ implies $a R c$
and (2) antisymmetric $a R b$ implies not($b R a$).

example: $<$ $>$ “is a prefix of”

“is younger than” “is a descendent of”

“is a superclass of”

Total Ordering

An order relation R is total if, for every a, b , either $a=b$, $a R b$ or $b R a$. “trichotomy”

Example: $<$ on real numbers.

Otherwise: partial ordering. example: “is an ancestor of”. “came to class before”.

(Why are these orderings only partial?)

Sorting

Prerequisites: a total ordering, R .

Input: an unordered collection of things.

Output: a list containing the same things,
now in order

$(A[0] R A[1] R A[2] R \dots R A[n-1])$

How to Sort

Basic idea: Divide and Conquer!

(a) QuickSort. Choose a “pivot” $P = A[i]$. Split the rest of A into 2 sides: less than P , and more than P . Place these sides in the correct order: $(< P) P (> P)$. Finally, recursively sort the two sides.

(b) MergeSort. Split the list into two equal parts. Recursively sort each part. Finally, “splice” them together in $O(n)$ time.

Analysis of MergeSort

Let $T(n)$ denote the (worst case) running time on an array of length n .

$$T(n) \leq 2T(n/2) + C n \quad (\text{recurrence relation})$$

Analysis of MergeSort

Let $T(n)$ denote the (worst case) running time on an array of length n .

$$T(n) \leq 2T(n/2) + C n \quad (\text{recurrence relation})$$

$$\leq 2(2T(n/4) + C(n/2)) + C n$$

$$= 4 T(n/4) + 2 C n$$

$$\leq 4(2T(n/8) + C(n/4)) + 2 C n$$

$$= 8 T(n/8) + 3 C n$$

$$\dots = n T(1) + \log(n) C n = O(n \log n).$$

“Analysis” of QuickSort

How big do we expect the side “ $< P$ ” to be, typically?

“Analysis” of QuickSort

How big do we expect the side “ $< P$ ” to be, typically?

If it were always close to $(n/2)$, then we would expect to get the same recurrence as for MergeSort:

$$T(n) \leq 2 T(n/2) + C n.$$

So, the solution would be the same,
 $O(n \log n)$ “nearly linear time”

Analysis of QuickSort

Let $T(n)$ = worst-case running time of QuickSort.

$$T(n) \leq C n + T(\text{left side}) + T(\text{right side}).$$

left side + right side = $n-1$. So, $T(\text{left side}) + T(\text{right side}) \leq T(n-1)$. This case can happen! (Pivot could be max or min elt.)

$$T(n) \leq C n + T(n-1). \text{ Unroll this recurrence.}$$

$$T(n) = O(n^2). \text{ (Actually, also } \Omega(n^2)\text{.)}$$

QuickSort Rmks

Although worst-case performance is quadratic, QuickSort tends to perform very well in practice.

(a) With randomized pivot, average running time is provably $O(n \log n)$.

(b) Practical advantages over MergeSort: sorting in place, improved locality of reference (good for memory caching).

Searching

Say we want to store a set of data, such as UNM student names. How quickly can we check whether an input equals the name of a student?

Searching

Say we want to store a set of data, such as UNM student names. How quickly can we check whether an input equals the name of a student?

Goal: $O(\log N)$, where N is the total number of students.

Method: Binary search!

Binary Search

Prerequisite: Totally Ordered Data.

Store Data in a Sorted Array.

Let $T(N)$ = worst-case time to test a name.

Recurrence: $T(N) \leq C + T(N/2)$.

unroll!

Binary Search

Prerequisite: Totally Ordered Data.

Store Data in a Sorted Array.

Let $T(N)$ = worst-case time to test a name.

Recurrence: $T(N) \leq C + T(N/2)$.

$$\leq 2 C + T(N/4)$$

$$\leq 3 C + T(N/8) \leq \dots \leq (\log N) C + T(1)$$

$$= O(\log N).$$

Summary

With a total ordering, can sort in time $O(N \log N)$. In a sorted list, can search in time $O(\log N)$.

Variant: Binary Search Tree

BST is a data structure providing the following operations:

add

remove

is_element

Goal: These 3 operations run fast!

Variant: Binary Search Tree

Data structure:

```
class Node<T> {  
    T data;  
    Node leftChild, rightChild;  
}
```

Recall: these are “references” or “pointers”

Invariant: $\text{leftChild.data} < \text{data} < \text{rightChild.data}$

Variant: Binary Search Tree

Time for these operations:

add

remove

is_element

All proportional to $\text{depth}(\text{tree})$.

Ideally, $\log(N)$. “complete” binary tree.

Problem: may become unbalanced.

Priority Queues

Stores a collection of data

Each data has a numeric “key value”

operations supported: add, delete,
extract_min.

guarantees: $O(\log n)$ time per operation

n = current size of collection.

Where does the name come from?

The Name

Queue: operations add, delete, get_next

first-in, first-out (FIFO) data flow.

Often implemented as linked list.

Priority Queue: whenever-in, highest-priority first-out (WHiPFO) data flow.

(A priority queue is **not** a kind of queue, in the standard sense)

In Java

`java.util.PriorityQueue`

(look at API)

Implementing a PQ

Idea 1: Maintain a sorted list

Then, to `extract_min`, just need to grab the first element, and point to the second one.

What will it cost to insert an element?

Implementing a PQ

Idea 1: Maintain a sorted list

Takes $\Omega(n)$ time to find/add/delete. No good.

Idea 2: Maintain a sorted array.

Implementing a PQ

Idea 1: Maintain a sorted list

Takes $\Omega(n)$ time to find/add/delete. No good.

Idea 2: Maintain a sorted array.

Can use binary search to find, but add/delete still take $\Omega(n)$ time. No good!

Implementing a PQ

Idea 1: Maintain a sorted list

Takes $\Omega(n)$ time to find/add/delete. No good.

Idea 2: Maintain a sorted array.

Can use binary search to find, but add/delete still take $\Omega(n)$ time. No good!

Idea 3: Special kind of tree called a “heap”

Binary Trees

Data is stored in “nodes”.

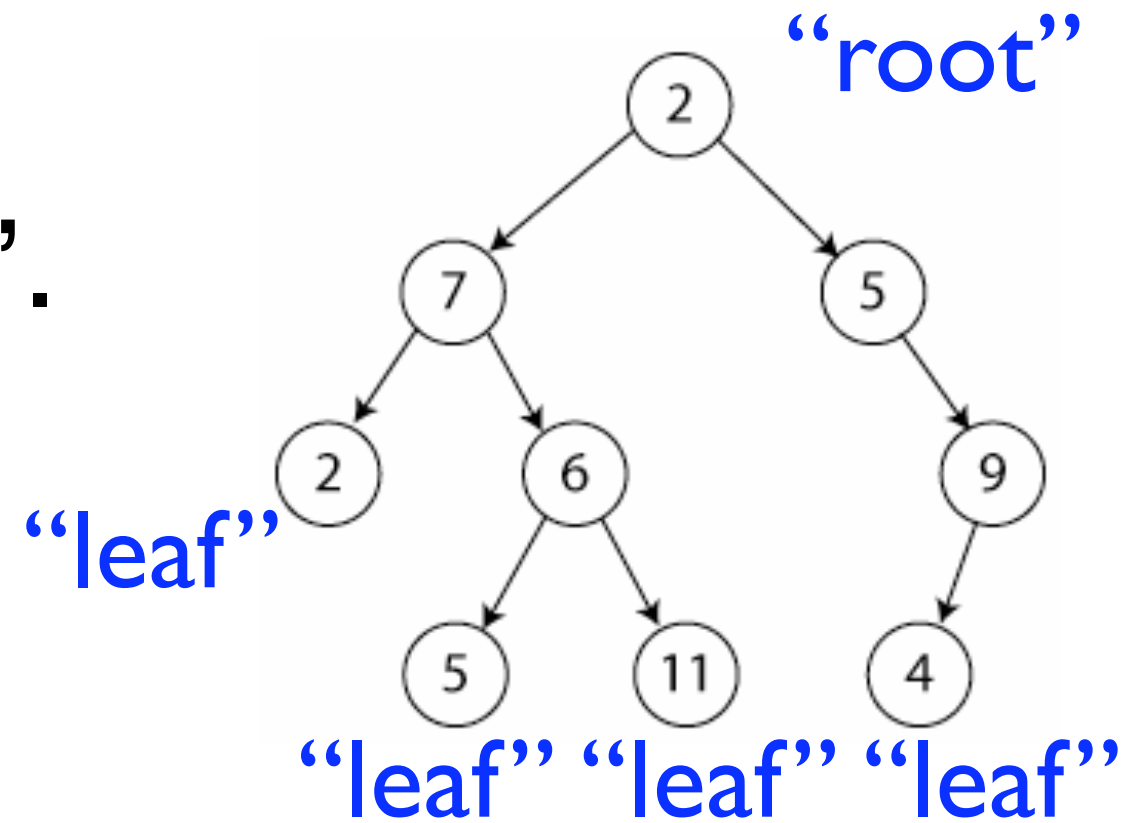
Each node has 4 fields:

data

parent (either a ref to a node, or “null”)

left_child (reference to a node or null)

right_child (reference to a node or null)



Heap Order Property

We say a tree storing “key” values satisfies the (min-) **heap order property** if it is always the case that the parent of a node stores a value \leq than the node does.

Heap Order Property

We say a tree storing “key” values satisfies the (min-) **heap order property** if it is always the case that the parent of a node stores a value \leq than the node does.

Such a tree is called a “**heap.**”

Heap Order Property

We say a tree storing “key” values satisfies the (min-) **heap order property** if it is always the case that the parent of a node stores a value \leq than the node does.

Such a tree is called a “**heap.**”

A heap is called “**balanced**” if every layer except perhaps the bottom one, has the maximum possible number of nodes.

Heap Order Property

We say a tree storing “key” values satisfies the (min-) **heap order property** if it is always the case that the parent of a node stores a value \leq than the node does.

Such a tree is called a “**heap.**”

A heap is called “**balanced**” if every layer except perhaps the bottom one, has the maximum possible number of nodes.

Q: What is this number?

Heap Order Property

We say a tree storing “key” values satisfies the (min-) **heap order property** if it is always the case that the parent of a node stores a value \leq than the node does.

Such a tree is called a “**heap.**”

A heap is called “**balanced**” if every layer except perhaps the bottom one, has the maximum possible number of nodes.

Q: What is this number? 2^L for the L'th level away from the root. (“**depth L**”)

Heap Order Property

What can we do with a heap?

Can we search it quickly?

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Can we extract_min quickly?

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Can we extract_min quickly?

Well, we can find_min quickly. But if we extract it, we will have to replace the root.

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Can we extract_min quickly?

Well, we can find_min quickly. But if we extract it, we will have to replace the root.

What about adding an element?

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Can we extract_min quickly?

Well, we can find_min quickly. But if we extract it, we will have to replace the root.

What about adding an element? Stick it in a leaf.

Heap Order Property

What can we do with a heap?

Can we search it quickly?

No. (whiteboard)

Can we extract_min quickly?

Well, we can find_min quickly. But if we extract it, we will have to replace the root.

What about adding an element? Stick it in a leaf. But it might violate the order property!

Reading: Heapify-Up, Heapify-Down

Goal: Fix a near-heap that has just one value out of place.

If it's smaller than its parent, swap it with its parent. Recurse! (Heapify-up)

If it's bigger than a child, swap it with the smaller child. Recurse! (Heapify-down)

Applet at <http://people.ksp.sk/~kuko/bak/index.html>

Next P.A.

A 2-sided Priority Queue.

Can `extract_min` and `extract_max`, both in time $O(\log N)$.

Design: How can this be achieved?

Don't Forget: Quiz on Thursday. Finish HW!