

## Bounds on Sorting



Lecture 14  
CS211 - Fall 2006

## Prelim Announcements

- Prelim 1
  - Tonight 7:30 - 9:00pm
  - Last names starting with **A-B**: HO 314
  - Last names starting with **C-E**: HO 206
  - Last names starting with **F-Z**: OH 155
- Check course website for latest info
- Grades will be available tomorrow (Friday)
  - This is the last day to drop a course

## More Announcements

- Using consultants
  - Do not work in consulting room after receiving help
    - Work somewhere else so other students can ask questions
  - Do not use consultants as "human compilers"
    - You are responsible for testing your code on your own
    - Not incrementally with a consultant

## Sorting Algorithm Summary

- The ones we have discussed
  - Insertion Sort
  - Selection Sort
  - Merge Sort
  - Quick Sort
- Other sorting algorithms
  - Heap Sort (come back to this)
  - Shell Sort (in text)
  - Bubble Sort (nice name)
  - Radix Sort
  - Bin Sort
  - Counting Sort
- Why so many? Do Computer Scientists have some kind of sorting fetish or what?
  - Stable sorts: **Ins, Sel, Mer**
  - Worst-case  $O(n \log n)$ : **Mer, Hea**
  - Expected-case  $O(n \log n)$ : **Mer, Hea, Qui**
  - Best for nearly-sorted sets: **Ins**
  - No extra space needed: **Ins, Sel, Hea**
  - Fastest in practice: **Qui**
  - Least data movement: **Sel**

## Programming Problem Strategies

- Goal: Make it easier to solve programming problems
- Algorithm Design Methods
  - I can design an algorithm to solve this
  - Examples: Divide & Conquer, Greedy, Dynamic Programming
- Basic Data Structures
  - I recognize this; I can use this well-known data structure
  - Examples: Stack, Queue, Priority Queue, Dictionary
- Problem Reductions
  - I can change this problem into another with a known solution
  - Or, I can show that a reasonable algorithm is most-likely impossible
  - Examples: reduction to network flow, NP-complete problems

## Recall: Analysis of MergeSort

- Time for Merge is  $O(n)$  where  $n$  is the number of elements being merged
- Time for MergeSort
  - $T(n) = 2T(n/2) + O(n)$   
and  $T(1) = O(1)$
  - Recurrence can be simplified to  $T(n) = 2T(n/2) + n$
  - Solution is  $T(n) = O(n \log n)$
- One solution method for this recurrence
  - Can divide by  $n$  to get  $T(n)/n = T(n/2)/(n/2) + 1$
  - Define  $S(n) = T(n)/n$
  - $S(n) = S(n/2) + 1$
  - Easy to see that  $S(n) = 2 + \log n$
  - Thus  $T(n) = n(2 + \log n)$  or  $T(n) = O(n \log n)$

## Solving Recurrences

Recurrences are important when using Divide & Conquer to design an algorithm

To solve  $T(n) = aT(n/b) + f(n)$  compare  $f(n)$  with  $n^{\log_b a}$

Solution techniques:

- Can sometimes change variables to make it into a simpler recurrence
  - Make a guess then prove the guess correct by induction
  - Build a recursion tree and use it to determine solution
  - Can use the *Master Method*
    - A "cookbook" scheme that handles many common recurrences
- Solution is  $T(n) = O(f(n))$  if  $f(n)$  grows more rapidly
  - Solution is  $T(n) = O(n^{\log_b a})$  if  $n^{\log_b a}$  grows more rapidly
  - Solution is  $T(n) = O(f(n) \log n)$  if both grow at same rate
  - Not an exact statement of the theorem [ $f(n)$  must be "well-behaved"]
  - See text for a similar theorem

## Recurrence Relation Examples

- $T(n) = T(n-1) + 1$  [Linear Search]
  - $T(n) = O(n)$
- $T(n) = T(n-1) + n$  [QuickSort worst-case]
  - $T(n) = O(n^2)$
- $T(n) = T(n/2) + 1$  [Binary Search]
  - $T(n) = O(\log n)$
- $T(n) = T(n/2) + n$ 
  - $T(n) = O(n)$
- $T(n) = 2T(n/2) + n$  [MergeSort]
  - $T(n) = O(n \log n)$

## Recurrences & CS211

- Solving recurrences is like integration
  - No general technique works for all recurrences
- For CS 211, we just expect you to remember a few common patterns

## Lower Bounds on Sorting: Goals

- Goal: Determine the minimum time *required* to sort  $n$  items
- Note: we want *worst-case* not *best-case* time
  - Best-case doesn't tell us much; for example, we know Insertion Sort takes  $O(n)$  time on already-sorted input
  - We want to determine the *worst-case* time for the *best-possible* algorithm
- But how can we prove anything about the *best possible* algorithm?
  - We want to find characteristics that are common to *all* sorting algorithms
  - Let's try looking at *comparisons*

## Lower Bounds on Sorting: Notation

- Suppose we want to sort the items in the array  $B[ ]$
- Let's name the items
  - $a_1$  is the item initially residing in  $B[1]$ ,  $a_2$  is the item initially residing in  $B[2]$ , etc.
  - In general,  $a_i$  is the item initially stored in  $B[i]$
- Rule: an item keeps its name forever, but it can change its location
  - Example: after  $\text{swap}(B,1,5)$ ,  $a_1$  is stored in  $B[5]$  and  $a_5$  is stored in  $B[1]$

## The Answer to a Sorting Problem

- An *answer* for a sorting problem tells where each of the  $a_i$  resides when the algorithm finishes
- How many answers are possible?
- The *correct* answer depends on the actual values represented by each  $a_i$
- Since we don't know what the  $a_i$  are going to be, it has to be *possible* to produce each permutation of the  $a_i$
- For a sorting algorithm to be valid it must be possible for that algorithm to give any of  $n!$  potential answers

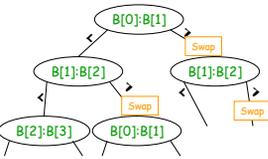
## Comparison Trees

- Any sorting algorithm performs some sequence of comparisons, depending on input

- Insertion sort on 2 3 1 4:  
2<3? 3<1? 2<1? 3<4?
- Insertion sort on 1 3 2 4:  
1<3? 2<3? 1<2? 3<4?

- We can display a sorting algorithm as a tree showing the comparisons that can occur

- Insertion sort on B[0], B[1], B[2], B[3]



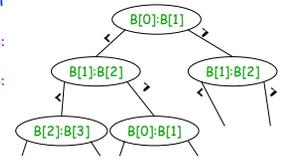
- We don't really need to show everything

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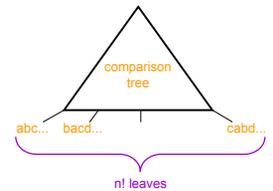
- We don't really need to show everything
  - Let's just show the comparisons

## Comparison Tree Comments

- Any algorithm can be "unrolled" to show the comparisons that are (potentially) performed
  - In general, you get a comparison tree
- If the algorithm fails to terminate for some input then the comparison tree is infinite
- The height of the comparison tree (plus one) represents the worst-case number of comparisons for that algorithm

## Comparison Tree for Sorting

- Every sorting algorithm has a corresponding comparison tree
  - Note that other stuff happens during the sorting algorithm, we just aren't showing it in the tree
- The comparison tree must have  $n!$  (or more) leaves because a valid sorting algorithm must be able to get any of  $n!$  possible answers
- Comparison tree for sorting  $n$  items:



## Time vs. Height

- The worst-case time for a sorting method must be  $\geq$  the height of its comparison tree
  - The height corresponds to the worst-case number of comparisons
  - Each comparison takes  $\Theta(1)$  time
  - The algorithm is doing more than just comparisons
- What is the minimum possible height for a binary tree with  $n!$  leaves?
  - Height  $\geq \log(n!) = \Theta(n \log n)$
- This implies that any comparison-based sorting algorithm must have a worst-case time of  $\Omega(n \log n)$ 
  - Note: this is a lower bound; thus, the use of big-Omega instead of big-O

## Using the Lower Bound on Sorting

- Claim: I have a PQ
  - Insert time:  $O(1)$
  - GetMax time:  $O(1)$
- True or false?
- False (for general sets) because if such a PQ existed, it could be used to sort in time  $O(n)$
- Claim: I have a PQ
  - Insert time:  $O(\log \log n)$
  - GetMax time:  $O(\log \log n)$
- True or false?
- False (for general sets) because it could be used to sort in time  $O(n \log \log n)$
- True for items with priorities in range  $1..n$  [van Emde Boas] (Note: such a set can be sorted in  $O(n)$  time)

## Sorting in Linear Time

- There are several sorting methods that take linear time
  - Counting Sort
    - Sorts integers from a small range:  $[0..k]$  where  $k = O(n)$
  - Radix Sort
    - The method used by the old card-sorters
    - Sorting time  $O(dn)$  where  $d$  is the number of "digits"
  - Others...
- How do these methods get around the  $\Omega(n \log n)$  lower bound?
  - They don't use comparisons

## Best Sorting Method?

- What sorting method works best?
  - QuickSort is best general-purpose sort
    - But it's not stable
  - MergeSort is a good choice if you need a stable sort
  - Counting Sort or Radix Sort can be best for some kinds of data