

## CSE 326: Data Structures

### Topic #13: Sorting Lower Bounds and Breaking the $\Omega(n \log n)$ Barrier

Ashish Sabharwal  
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## Today's Outline

– Thanks for the feedback!

- Finish QuickSort, QuickSelect
- **Lower Bounds**
  - general flavor
  - for sorting
- Breaking the barrier: **BucketSort, RadixSort**

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## Feedback Summary

### Things going well

- pace of lectures
- tablet PC stuff
- group quizzes, midterm review

### Issues

- pace of lectures
- tablet PC stuff
- quiz section coordination with lecture / other Q.S.
- PS slides vs. PDF slides



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## Lower Bounds: for An Algorithm

**Algorithm  $A$  has a lower bound  $\Omega(T(n))$  if there exists an input of size  $n$  on which  $A$  takes  $\Omega(T(n))$  time.**

E.g.

- insertion in Binary Heap has lower bound  $\Omega(\log n)$  because inserting a very small element requires  $\Omega(\log n)$  percolateUp operations.
- Insertion Sort has lower bound  $\Omega(n^2)$  because it needs so many operations when input is reverse sorted

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## Lower Bounds: for A Problem

**Problem  $P$  has a lower bound  $\Omega(T(n))$  if for every algorithm  $A$  that solves  $P$ , there exists an input of size  $n$  on which  $A$  takes  $\Omega(T(n))$  time.**

- Very hard to prove because they must hold for *any* algorithm to solve  $P$  !!!
- Strategy: restrict computational model
  - Turing machines: very general, no lower bounds known
  - Circuits with *and, or, not* gates : more structured, still hard
  - Circuits w/o any *not* gates : know non-trivial bounds
  - Proof systems : the area I work in
  - ...

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## Lower Bounds: for Classes of Algorithms

**Problem  $P$  has a lower bound  $\Omega(T(n))$  under class  $C$  if for every algorithm  $A \in C$  that solves  $P$ , there exists an input of size  $n$  on which  $A$  takes  $\Omega(T(n))$  time.**

Still quite hard, but feasible. E.g.

- Sorting using only comparisons:  $\Omega(n \log n)$ 
  - Applies to insertion sort, selection sort, bubble sort, shell sort, merge sort, quick sort, heap sort, tree sort, and *any other sorting algorithm based only on comparisons!*
- Sorting by only exchanging adjacent elements:  $\Omega(n^2)$ 
  - Average-case; applies to insertion sort, selection sort, bubble sort, and *any other sorting algorithm satisfying the criterion!*

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## Lower Bound #1

**Theorem:** Any algorithm that sorts by comparing and exchanging only adjacent elements must take  $\Omega(n^2)$  time *on average*.

*Details on white board; in book*

*Proof idea:*

- Count the average number of inversions in an array
- Argue that each exchange of adjacent elements can fix only one inversion
  - Gives  $\Omega(n^2)$  average-case lower bound for insertion sort, selection sort, bubble sort, and *any* other sorting algorithm that satisfies the criterion!

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## Lower Bound #2

**Theorem:** Any algorithm that sorts by only comparing elements must take  $\Omega(n \log n)$  time *in the worst case*.

*Details on white board; in book*

*Proof idea:*

- Represent given algorithm as a decision tree
- Argue that decision tree must have depth  $\Omega(n \log n)$
- Conclude that algorithm must take so much time
  - Gives  $\Omega(n \log n)$  worst-case lower bound for *all* sorting algorithms we have seen, and *any* others that satisfy the criterion!

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## BucketSort (aka BinSort)

If all values to be sorted are *known* to be between 1 and  $K$ , create an array `count` of size  $K$ , increment counts while traversing the input, and finally output the result.

**Example**  $K=5$ . Input = (5,1,3,4,3,2,1,1,5,4,5)



count array	
1	
2	
3	
4	
5	



Running time?

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## BucketSort Complexity: $\Theta(n+K)$

- Case 1:  $K$  is a constant
  - BinSort is linear time
- Case 2:  $K$  is variable
  - Not simply linear time
  - Could even be worst than quadratic!
- Case 3:  $K$  is constant but large (e.g.  $2^{32}$ )
  - ???

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## Digression: Stable Sorting

- Stable Sorting algorithm
  - Items in input with the same value end up in the same order as when they began.
- Are the following stable:
  - BucketSort?
  - MergeSort?
  - QuickSort?

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## Fixing impracticality: RadixSort

- Radix = “The base of a number system”
  - We’ll use 10 for convenience, but could be anything
- Idea: BucketSort on each digit, least significant to most significant (lsd to msd)

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## RadixSort – magic!

- Input: 126, 328, 636, 341, 416, 131, 328

BucketSort on lsd:

0	1	2	3	4	5	6	7	8	9

BucketSort on next-higher digit:

0	1	2	3	4	5	6	7	8	9

BucketSort on msd:

0	1	2	3	4	5	6	7	8	9

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## Not magic... it provably works

Claim: after  $i^{\text{th}}$  BucketSort,  $i$  lsd's are sorted.

- e.g.  $K=10, i=3$ , values 1776 and 8234:  
8234 comes before 1776 after the 3<sup>rd</sup> pass.

Proof: By induction. (left as an exercise)

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## Time to play at home...

- RadixSort the following values using  $K=10$ :  
95, 3, 927, 187, 604, 823, 805, 422, 159, 98, 123,  
3, 987, 125.
- Given arbitrary numbers  $A_1, A_2, \dots, A_n$ , and a base  $K$ , what is the overall running time of radix sort?

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(extra space)

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## Radixsort: Complexity

- How many passes?
- How much work per pass?
- Total time?
- Conclusion?
- In practice
  - RadixSort only good for large number of elements with relatively small values
  - Hard on the cache compared to MergeSort/QuickSort

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## What data types can you RadixSort?

- Any type  $T$  that can be BucketSorted
- Any type  $T$  that can be broken into parts  $A$  and  $B$  such that
  - You can reconstruct  $T$  from  $A$  and  $B$
  - $A$  can be RadixSorted
  - $B$  can be RadixSorted
  - $A$  is always more significant than  $B$ , in ordering

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## RadixSorting Numbers

- 1-digit numbers can be BucketSorted
- 2 to 5-digit numbers can be BucketSorted without using too much memory
- 6-digit numbers, broken up into A=first 3 digits, B=last 3 digits, can be RadixSorted
  - A and B can reconstruct original 6-digits
  - A and B are both RadixSortable as above
  - A always more significant than B

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## RadixSorting Strings

- 1 character can be BucketSorted
- A few characters can be BucketSorted
- Break larger strings into characters or groups of characters
  - e.g. break names into last name, first name; sort on first name, then sort (stably) on last name

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## To Do

- Keep working on Project #3
- Finish reading Chapter 7  
(don't spend too much time on External Sorting)

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