

## CS 361, Lecture 19

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- Q: What is a lowerbound on the runtime of any sorting algorithm?
- We know that  $\Omega(n)$  is a trivial lowerbound
- But all the algorithms we've seen so far are  $O(n \log n)$  (or  $O(n^2)$ ), so is  $\Omega(n \log n)$  a lowerbound?

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## Outline

- Lower Bound for Sorting by Comparison
- Bucket Sort
- Dictionary ADT

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## Comparison Sorts

- Definition: An sorting algorithm is a *comparison sort* if the sorted order they determine is based only on comparisons between input elements.
- Heapsort, mergesort, quicksort, bubblesort, and insertion sort are all comparison sorts
- We will show that any comparison sort must take  $\Omega(n \log n)$

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## Administrivia

- Appendix C.1 in the book is an excellent reference for background math on counting
- Appendix C.2 is good background for probability

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## Comparisons

- Assume we have an input sequence  $A = (a_1, a_2, \dots, a_n)$
- In a comparison sort, we only perform tests of the form  $a_i < a_j$ ,  $a_i \leq a_j$ ,  $a_i = a_j$ ,  $a_i \geq a_j$ , or  $a_i > a_j$  to determine the relative order of all elements in  $A$
- We'll assume that all elements are distinct, and so note that the only comparison we need to make is  $a_i \leq a_j$ .
- This comparison gives us a yes or no answer

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## Decision Tree Model

- A decision tree is a full binary tree that gives the possible sequences of comparisons made for a particular input array,  $A$
- Each internal node is labelled with the indices of the two elements to be compared
- Each leaf node gives a permutation of  $A$

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## Height of Decision Tree

- Q: What is the height of a binary tree with at least  $n!$  leaf nodes?
- A: If  $h$  is the height, we know that  $2^h \geq n!$
- Taking log of both sides, we get  $h \geq \log(n!)$

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## Decision Tree Model

- The execution of the sorting algorithm corresponds to a path from the root node to a leaf node in the tree.
- We take the left child of the node if the comparison is  $\leq$  and we take the right child if the comparison is  $>$
- The internal nodes along this path give the comparisons made by the alg, and the leaf node gives the output of the sorting algorithm.

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## Height of Decision Tree

- Q: What is  $\log(n!)$ ?
- A: It is

$$\begin{aligned}\log(n * (n-1) * \dots * 1) &= \log n + \log(n-1) + \dots + \log(1) \\ &\geq (n/2) \log(n/2) & (2) \\ &\geq (n/2)(\log n - \log 2) & (3) \\ &= \Omega(n \log n) & (4)\end{aligned}$$

- Thus any decision tree for sorting  $n$  elements will have a height of  $\Omega(n \log n)$

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## Leaf Nodes

- Any correct sorting algorithm must be able to produce each possible permutation of the input
- Thus there must be at least  $n!$  leaf nodes
- The length of the longest path from the root node to a leaf in this tree gives the worst case run time of the algorithm (i.e. the height of the tree gives the worst case runtime)

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## Take Away

- We've just proven that any comparison-based sorting algorithm takes  $\Omega(n \log n)$  time
- This does *not* mean that *all* sorting algorithms take  $\Omega(n \log n)$  time
- In fact, there are non comparison-based sorting algorithms which, under certain circumstances, are asymptotically faster.

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## Bucket Sort

- Bucket sort assumes that the input is drawn from a uniform distribution over the range  $[0, 1)$
- Basic idea is to divide the interval  $[0, 1)$  into  $n$  equal size regions, or buckets
- We expect that a small number of elements in  $A$  will fall into each bucket
- To get the output, we can sort the numbers in each bucket and just output the sorted buckets in order

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## Bucket Sort

```
//PRE: A is the array to be sorted, all elements in A[i] are between
//POST: returns a list which is the elements of A in sorted order
BucketSort(A){
  B = new List[]
  n = length(A)
  for (i=1;i<=n;i++){
    insert A[i] at end of list B[floor(n*A[i])];
  }
  for (i=0;i<=n-1;i++){
    sort list B[i] with insertion sort;
  }
  return the concatenated list B[0],B[1],...,B[n-1];
}
```

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## Bucket Sort

- If the input numbers are distributed uniformly over the range  $[0, 1)$ , then Bucket sort takes expected time  $O(n)$
- Proof of this is given in the book, make sure you understand it.

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## Dictionary ADT

A dictionary ADT implements the following operations

- *Insert(x)*: puts the item  $x$  into the dictionary
- *Delete(x)*: deletes the item  $x$  from the dictionary
- *IsIn(x)*: returns true iff the item  $x$  is in the dictionary

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## Dictionary ADT

- Frequently, we think of the items being stored in the dictionary as *keys*
- The keys typically have *records* associated with them which are carried around with the key but not used by the ADT implementation
- Thus we can implement functions like:
  - *Insert(k,r)*: puts the item  $(k,r)$  into the dictionary if the key  $k$  is not already there, otherwise returns an error
  - *Delete(k)*: deletes the item with key  $k$  from the dictionary
  - *Lookup(k)*: returns the item  $(k,r)$  if  $k$  is in the dictionary, otherwise returns null

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## Implementing Dictionaries

- The simplest way to implement a dictionary ADT is with a linked list
- Let  $l$  be a linked list data structure, assume we have the following operations defined for  $l$ 
  - *head(l)*: returns a pointer to the head of the list
  - *next(p)*: given a pointer  $p$  into the list, returns a pointer to the next element in the list if such exists, null otherwise
  - *previous(p)*: given a pointer  $p$  into the list, returns a pointer to the previous element in the list if such exists, null otherwise
  - *key(p)*: given a pointer into the list, returns the key value of that item
  - *record(p)*: given a pointer into the list, returns the record value of that item

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## In-Class Exercise

Implement a dictionary with a linked list

- Q1: Write the operation `Lookup(k)` which returns a pointer to the item with key `k` if it is in the dictionary or null otherwise
- Q2: Write the operation `Insert(k,r)`
- Q3: Write the operation `Delete(k)`
- Q4: For a dictionary with  $n$  elements, what is the runtime of all of these operations for the linked list data structure?
- Q5: Describe how you would use this dictionary ADT to count the number of occurrences of each word in an online book.

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## Dictionaries

- This linked list implementation of dictionaries is very slow
- Q: Can we do better?
- A: Yes, with hash tables, AVL trees, etc

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