

## Odds + Ends

Sorting, Selecting, Searching

We can sort in  $O(n \log n)$  time

Quicksort (average)

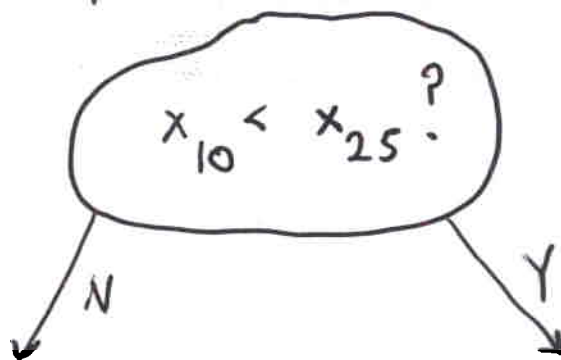
Mergesort (worst-case)

Is this bound tight?

# Decision Tree Model

Input: a permutation of  $n$  numbers

At each node, ask any yes-no question about the permutation (comparisons a special case)



Each permutation reaches a different leaf

Depth = # questions  $\leq$  time

Too broad: no accounting for deciding what questions to ask: program need not be of fixed size.

Too narrow: only binary decisions

There are  $n!$  permutations on  $n$  items.

$\lceil \lg(n!) \rceil = \lceil \log_2(n!) \rceil$  is a lower bound  
on the worst-case depth.

Stirling's approximation for  $n!$

$$n! \geq \sqrt{2\pi n} \left(\frac{n}{e}\right)^n$$

$$\Rightarrow \lceil \log_2 n! \rceil \geq n \log_2 n - n / \ln 2$$

$$\Rightarrow \text{sorting takes } n \lg n - n / \ln 2$$

comparisons (or binary decisions)

(worst-case)

Information-Theoretic Lower Bound

Average case?

Lower bound: sum of depths of leaves /  $n!$

sum of depths of leaves = external path length

minimized for  $N$  external nodes

at  $(q+1)N - 2^q$  where  $q = \lceil \lg N \rceil$

(complete binary tree: all leaves

on at most 2 levels)

$$EPL = N \lg N + 1 + \theta - 2^\theta$$

$$\text{where } \theta = \lg N + \theta$$

$$1 + \theta - 2^\theta \geq 0$$

$$\leq .0861$$

For sorting, ave length is  $\geq EPL(n!) / n!$

$$\geq \lg n! \geq n \lg n - n / \ln 2$$

Ave case analysis of quicksort

Compare each item to splitter  
( $n-1$  comparisons)

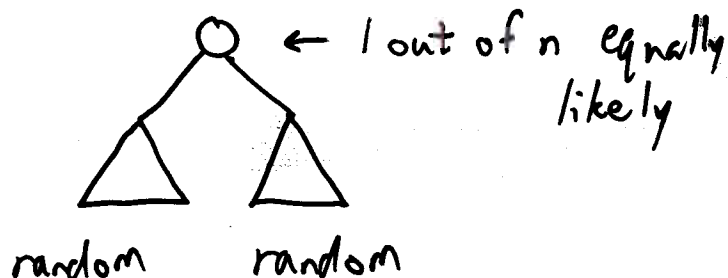
Recursively sort smaller set, larger set

$$A_n = n-1 + \frac{1}{n} \sum_{k=0}^{n-1} (A_k + A_{n-k-1})$$

$$A_0 = A_1 = 0$$

$A_n/n + 1$  is also the ave depth  
of an unbalanced binary tree

constructed by random insertions



Observe: items  $i$  and  $j$  are compared iff one of them is chosen as a splitter before anything in between. The chance of this is  $2/(j-i+1)$ .

Expected # comparisons:

$$\sum_{i=1}^{n-1} \sum_{j>i} 2/(j-i+1) = \sum_{i=1}^{n-1} \sum_{k=2}^{n-i+1} 2/k$$

$$= \sum_{l=2}^n \sum_{k=2}^l 2/k$$

$$\leq 2n \ln(n) - O(n) \leq 1.3863 n \lg n$$

$$H_l = \sum_{k=1}^l 1/k \leq \ln l + 1$$

## Worst-case analysis of merge sort

Divide into two halves

Sort halves

Merge

$$W(n) = W(\lceil n/2 \rceil) + W(\lfloor n/2 \rfloor) + n - 1 = \sum_{k=1}^n \lceil \lg k \rceil$$

$$W(n) \leq n \lceil \lg n \rceil = 2^{\lceil \lg n \rceil} + 1 = n \lg n - O(n)$$

Selection in  $O(n)$  time

Find the  $k^{\text{th}}$  out of  $n$

Quick select: like quick sort, but only

recur in the half containing the desired item

if small half contains  $i \geq k$ , look for  $k^{\text{th}}$

in small half

if small half contains  $k-1$ , splitter is  $k^{\text{th}}$

else look for  $k-(i+1)^{\text{st}}$  in large half

$O(n)$  on average (analysis like

quicksort)



Worst-case  $O(n)$ : double recursion

Divide into  $\lceil n/5 \rceil$  sets of 5 (or less)

Find medians of 5

Find medians of medians

Use  $m$  of  $m$  as a splitter

Recur in appropriate half

$$S(n) = O(n) + S(n/5) + S(7n/10)$$

←  $3n/10$  discarded

linear since  $1/5 + 7/10 = 9/10 < 1$

# Optimum Search Trees

Lower bound on weighted (external)

path length in a binary tree

(entropy bound)

Positive weights  $p_i$ ,  $P = \sum p_i$

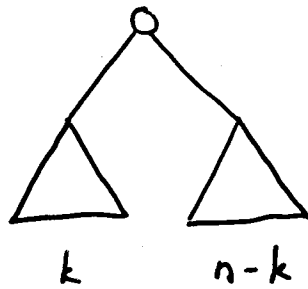
$$WEPL' \geq \sum_{i=1}^n p_i \lg(P/p_i)$$

WEPL' counts edges, not nodes

(+P to get node bound)

Proof by induction

$$n \geq 2$$



$$\begin{aligned} \text{WEPL}' &\geq P + \sum_{i=1}^k p_i \lg(P/p_i) + \sum_{i=k+1}^n p_i \lg((P-P')/p_i) \\ &\geq \sum_{i=1}^n p_i \lg(P/p_i) + f(P') \end{aligned}$$

for some  $k$ , where

$$f(P') = P + P' \lg P' + (P-P') \lg(P-P') - P \lg P$$

$f(P')$  is non-negative, taking its min val 0

$$\text{at } P' = P/2$$

This bound is achievable to within  $P$

(non-alphabetic: Huffman codes)

or to within  $2P$

(alphabetic: Knuth-(internal) or

Hu-Tucker(external))

What about internal path length?

$$WIPL \geq \sum_{i=1}^n p_i \lg(P/p_i) - \lg \left( \sum_{i=1}^n p_i \lg(P/p_i) \right) - O(1)$$

if  $P=1$