

How fast can we sort?

depends on model of what you can do with the elements.

e.g. quicksort, heapsort, mergesort, insertion sort

$$\Theta(n \lg n) \text{ rand} \quad \Theta(n \lg n) \quad \Theta(n \lg n) \quad \Theta(n^2) \\ \text{or } \Theta(n^2)$$

Can we do better than  $\Theta(n \lg n)$ ?

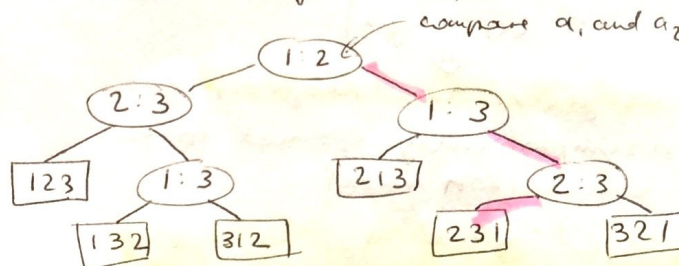
Comparison sorting (model):

only use comparisons to determine rel. order of elements

Decision-tree model:

Example: sort  $\langle a_1, a_2, a_3 \rangle$

e.g. 8 4 6



in general  $\langle a_1, \dots, a_n \rangle$

- each internal node has label  $i:j$   $i, j \in \{1, 2, \dots, n\}$
- means: compare  $a_i$  vs.  $a_j$
- left subtree gives subsequent comparisons if  $a_i \leq a_j$
- right subtree gives subsequent comparisons if  $a_i > a_j$
- even leaf gives a permutation  $\langle \pi(1), \pi(2), \dots, \pi(n) \rangle$  such that  $a_{\pi(1)} \leq a_{\pi(2)} \leq \dots \leq a_{\pi(n)}$

permutation function

any comparison sort can be reduced to a decision tree on input  $n$

Decision tree model comparison sort:

- one tree for each  $n$  ← one tree assumption breaks in randomized
- view algorithm as splitting whenever it makes a comparison
- tree lists comparisons along all possible instruction traces

size of tree: leaves have to represent each permutation of list of size  $n$   $\Rightarrow n!$  permutations (exponential)

$\Rightarrow$  graphical representation as decision tree is not practical as a representation of a comp. sort algorithm  
pseudocode is constant length representation



- running time (# comparisons) = length of path
- worst case run time = height of tree

Lower bound on decision-tree sorting:

Any decision tree sorting  $n$  elements has height  $\Omega(n \lg n)$

Proof: - # leaves must be  $\geq n!$

- height  $h \Rightarrow$  # leaves  $\leq 2^h \Rightarrow n! \leq 2^h$

$\Omega(n \lg n)$  for height of any decision tree



all comparison sorts run in  $\Omega(n \lg n)$



mergesort and heapsort are asymptotically optimal in the comparison model

$$\begin{aligned} \Rightarrow h &\geq \lg n! && (\lg \text{ is monotonically increasing}) \\ \text{Stirling} &\rightarrow \geq \lg \left(\frac{n}{e}\right)^n && \Rightarrow \text{ineq. stays the same} \\ &= n \lg \left(\frac{n}{e}\right) \\ &= n (\lg n - \lg e) \end{aligned}$$

actually  $\rightarrow \Omega(n \lg n)$  ✓  
 $\Theta$  but we care only about  $\Omega$

in randomised algo we get a probability distr. over trees, due to coin flips

$\hookrightarrow$  proof applies to any tree  $\Rightarrow$  lower bound also for randomised comparison sorts

randomised quicksort is asymptotically optimal in expectation  $\Leftarrow$

## Sorting in linear time:

cannot sort better than  $\Theta(n)$   $\rightarrow$  need to look at data

Counting sort:

Input:  $A[1 \dots n]$   
 each  $A[i] \in \{1, 2, \dots, k\}$

Output:  $B[1 \dots n]$  sorting of  $A$

Aux storage:  $C[1 \dots k]$

Counting sort:

for  $i \leftarrow 1$  to  $k$   
 do  $C[i] \leftarrow 0$

for  $j \leftarrow 1$  to  $n$   
 do  $C[A[j]] \leftarrow C[A[j]] + 1$   
 //  $C[i] = |\{key = i\}|$

for  $i \leftarrow 2$  to  $k$   
 do  $C[i] \leftarrow C[i] + C[i-1]$   
 //  $C[i] = |\{key \leq i\}|$

for  $j \leftarrow n$  down to  $1$   
 do  $B[C[A[j]]] \leftarrow A[j]$   
 distribution  $\rightarrow C[A[j]] \leftarrow C[A[j]] - 1$



Ex:  $n=5$   
1st for loop  
A = 

4	1	3	4	3
---	---	---	---	---

2nd for loop

3rd for loop

C = 

0	0	0	0
---	---	---	---

C = 

0	0	0	0
---	---	---	---

C = 

1	0	2	2
---	---	---	---

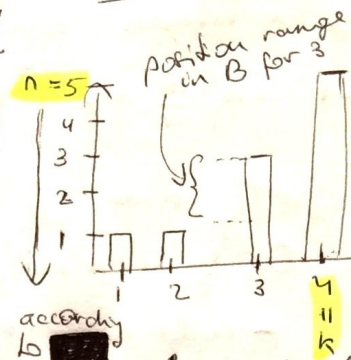
C = 

1	0	2	2
---	---	---	---

C = 

1	1	3	5
---	---	---	---

4th for loop



B = 

1	3	3	4	4
---	---	---	---	---

- get value from A
- get position of value in B according to cum. distr. in C
- update distr. in C

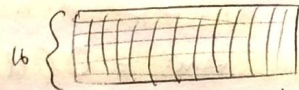
Time  $O(k+n)$

if  $k = O(n)$  then  $O(n)$

but as soon as  $k = O(n \log n) \rightarrow$  we switch to comparison sorting

Stable sort: preserves the relative order of equal elements

Radix sort (Hallenuth - 1880)



digit-by-digit

first: sort by most sig. digit first 10 80

right: sort by least sig. digit first

Ex: (3-digit As)

3	2	9
4	5	7
6	5	7
8	3	9
4	3	6
7	2	0
3	5	5

sorted  $\rightarrow$ 

7	2	0
3	5	5
4	3	6
4	5	7
6	5	7
3	2	9
8	3	9

same order is stable

sorted  $\rightarrow$ 

7	2	0
3	2	9
4	3	6
8	3	9
3	5	5
4	5	5
6	5	7

3 2 9  
3 5 5  
4 3 6  
4 5 5  
6 5 7  
7 2 0  
8 3 9

Correctness: induct on digit position  $t$

- assume sorted on low order  $t-1$  digits 111

- sort on digit  $t$

- if two elts have same  $t$ th digit  $\rightarrow$  same order by stability  $\rightarrow$  B's 111 are sorted
- if different  $t$ th digit,  $\Rightarrow$  sorted order

## Analysis:

- use counting sort / digit  $O(k+n)$  each round counting sort
- say  $n$  integers, each  $b$  bits (range  $= 0 \dots 2^b - 1$ )
- split into  $\frac{b}{r}$  "digits" each  $r$  bits (base  $2^r$ )



Time:  $O(\frac{b}{r} \cdot (n+k)) = O(\frac{b}{r} (n + 2^r))$

*# rounds*  $\downarrow$  *# of rounds*  $\nwarrow$  *counting sort run*

*my compact resembles the idea of Bloom filters*

- could differentiate with respect to  $r$ , set to 0

-  $\frac{b}{r} \cdot n$  wants  $r$  big,  $\frac{b}{r} 2^r$  wants  $r$  small

$\Rightarrow$  choose  $r$  max, subject to  $n \geq 2^r$

$r = \lg n$  (get some via differentiation)

$$\Rightarrow O\left(\frac{bn}{\lg n}\right)$$

if numbers in range  $0 \dots 2^b - 1$ ,

as a polynomial in  $0 \dots n^{d-1}$

then time  $= O(dn)$

*size of problem*

$O(\lg n)$   
bits long  
it's

||

advantage over

advantage over  $\Theta(n \lg n)$

counting sort

$$k = O(n \lg n)$$

radix sort

$$d = O(\lg n)$$

$$k = O(n \lg n)$$

$$\Theta(n \lg n)$$

comparison sort

if we know that  
numbers are  $O(\lg n)$  bits long  
consider radix