

TODAY: Linear-Time Sorting

- comparison model
- lower bounds:
  - searching:  $\Omega(\lg n)$
  - sorting:  $\Omega(n \lg n)$
- $O(n)$  sorting algorithms
  - counting sort
  - radix sort

(for small integers)

theorem  
proof  
counterexample

Lower bounds: claim

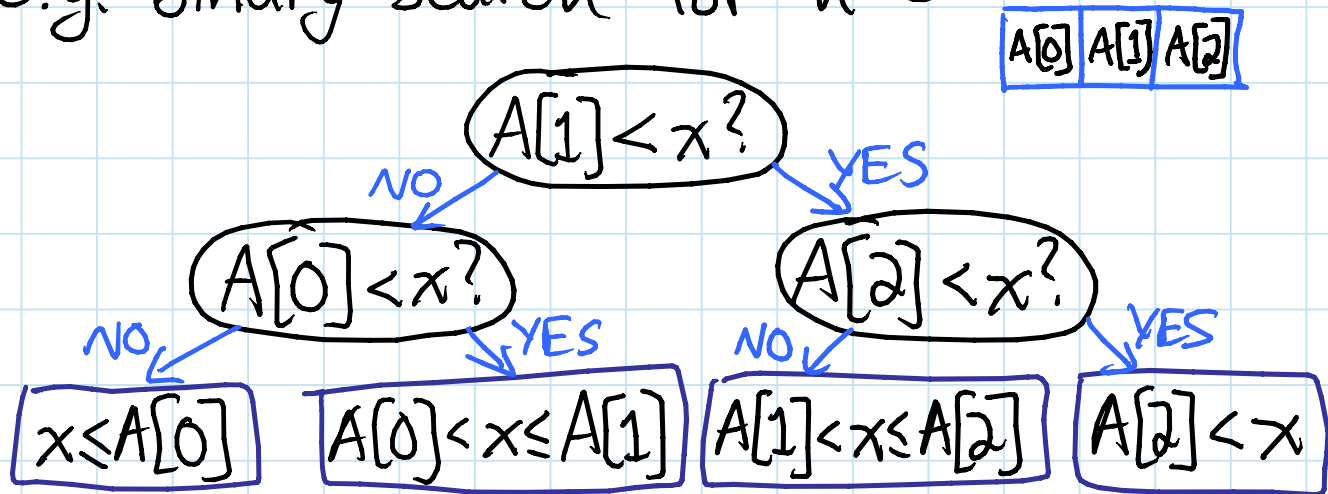
- searching among  $n$  preprocessed items requires  $\Omega(\lg n)$  time
    - $\Rightarrow$  binary search, AVL tree search optimal
  - sorting  $n$  items requires  $\Omega(n \lg n)$ 
    - $\Rightarrow$  mergesort, heap sort, AVL sort optimal
- ... in the comparison model

Comparison model of computation:

- input items are black boxes (ADTs)
- only support comparisons ( $<$ ,  $>$ ,  $\leq$ , etc.)
- time cost = # comparisons

Decision tree: any comparison algorithm can be viewed/specified as a tree of all possible comparison outcomes & resulting output, for a particular  $n$ :

- e.g. binary search for  $n=3$ :



- internal node = binary decision
- leaf = output (algorithm is done)
- root-to-leaf path = algorithm execution
- path length (depth) = running time
- height of tree = worst-case running time

In fact, binary decision tree model is more powerful than comparison model, and lower bounds extend to it.

## Search lower bound:

- # leaves  $\geq$  # possible answers  
 $\geq n$  (at least 1 per  $A[i]$ )
- decision tree is binary
- $\Rightarrow$  height  $\geq \lg n$

## Sorting lower bound:

- leaf specifies answer as permutation:  
 $A[3] \leq A[1] \leq A[9] \leq \dots$

- all  $n!$  are possible answers

$$\Rightarrow \# \text{ leaves} \geq n!$$

$$\Rightarrow \text{height} \geq \lg n!$$

$$= \lg (1 \cdot 2 \cdot \dots \cdot (n-1) \cdot n)$$

$$= \lg 1 + \lg 2 + \dots + \lg(n-1) + \lg n$$

$$= \sum_{i=1}^n \lg i$$

$$\geq \sum_{i=\frac{n}{2}}^n \lg i$$

$$\geq \sum_{i=\frac{n}{2}}^n \lg \frac{n}{2} \rightarrow = \lg n - 1$$

$$= \frac{n}{2} \lg n - \frac{n}{2} = \boxed{\Omega(n \lg n)}$$

- in fact  $\lg n! = n \lg n - O(n)$  via:

Sterling's formula:  $n! \sim \sqrt{2\pi n} \left(\frac{n}{e}\right)^n$

$$\Rightarrow \lg n! \sim n \lg n - \underbrace{(\lg e)n}_{O(n)} + \frac{1}{2} \lg n + \frac{1}{2} \lg(2\pi)$$

## Linear-time sorting:

if  $n$  keys are integers  $\in \{0, 1, \dots, k-1\}$ ,  
can do more than compare them  
 $\Rightarrow$  lower bounds don't apply  
- if  $k = n^{O(1)}$ , can sort in  $O(n)$  time  
OPEN:  $O(n)$  time possible for all  $k$ ? → fitting in a word

## Counting sort:

- $L$  = array of  $k$  empty lists }  $O(k)$   
linked or Python lists ↑
- for  $j$  in range( $n$ ):  
     $L[\text{key}(A[j])].\text{append}(A[j])$  }  $O(1)$  }  $O(n)$   
↑ random access using integer key
- output = []
- for  $i$  in range( $k$ ):  
    output.extend( $L[i]$ ) }  $O(\sum_i (1 + |L[i]|))$   
} =  $O(k+n)$

Time:  $\Theta(n+k)$  (also  $\Theta(n+k)$  space)

Intuition: count key occurrences using RAM → [L2]  
output  $\langle \text{count} \rangle$  copies of each key in order  
... but item is more than just a key

CLRS has cooler implementation of counting sort with counters, no lists ~  
but time bound is the same

Radix sort: [Herman Hollerith 1887 punchcards!] 80 cols.

- imagine each integer in base  $b$   
 $\Rightarrow d = \log_b k$  digits  $\in \{0, 1, \dots, b-1\}$
  - sort by least significant digit  $\rightarrow$
  - ...  $\rightarrow$  all  $n$  items
  - sort by most significant digit  $\rightarrow$
- $\hookrightarrow$  sort must be stable:  
preserve relative order of items  
with the same key  
 $\Rightarrow$  don't mess up previous sorting
- can extract in  $O(1)$  time  
 $(x // b^i) \% b$

e.g.

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

sort  $\Rightarrow$  sorted  $\Rightarrow$  sorted  $\Rightarrow$  sorted

- use counting sort for digit sort  
 $\Rightarrow \Theta(n+b)$  per digit  
 $\Rightarrow \Theta((n+b)d) = \Theta((n+b) \log_b k)$  total time
- minimized when  $b = n$

$$\Rightarrow \Theta(n \log_n k)$$
$$= O(nc) \text{ if } k \leq n^c$$

running time of  
radix sort