

## Announcements

- \* HW1 due on Thursday (Aug 28)
- \* Office Hours in Klaus 2108 (see Canvas or Piazza for Google Calendar)
- \* Exam 1 on Sep 18 (instead of Sep 16)
- \* Recordings on Canvas, Handwritten on Piazza

Plan for today: Complete Median finding, Dynamic Prog

## Median Finding

Given  $n$  numbers  $A[0, \dots, n-1]$ . ← say distinct for simplicity

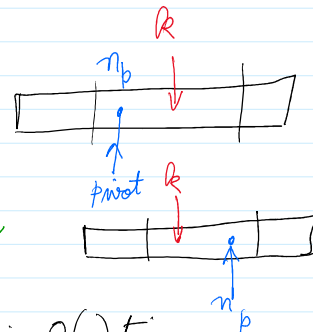
Given  $k \in \{1, 2, \dots, n\}$

Goal: Find the  $k$ -th largest number ←  $(k-1)$  smaller #s &  $n-k$  large #s

Sorting takes  $\Theta(n \log n)$  time. Can we do it faster?

Thm: We can achieve this in  $O(n)$  time.  
Blum, Pratt, Rivest, Tarjan-1972

Idea: (1) Find a 'good pivot' recursively.  $T(\frac{n}{5})$   
 $\geq \frac{3n}{10}$  elements larger &  $\geq \frac{3n}{10}$  elements smaller



(2) Argue that we can drop one of sides of the pivot in  $O(n)$  time

Pf: Calculate how many elems are less than pivot  $p$   
 $n_p$

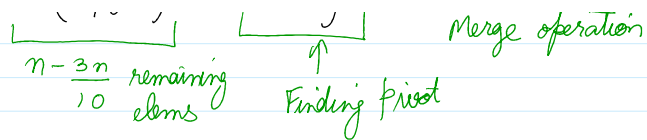
Case 1:  $n_p > k$

Drop all  $e > p$  & find  $k$ -th large in rem

Case 2:  $n_p \leq k$

Drop all  $e < p$  & find  $(k - n_p)$ -th largest in remain

(3) Get Recursion:  $T(n) \leq \underbrace{T(\frac{7n}{10})}_{\substack{n - \frac{3n}{10} \text{ remaining} \\ \text{in rem}}} + \underbrace{T(\frac{n}{5})}_{\substack{\uparrow \\ \text{Finding pivot}}} + \underbrace{\rho(n)}_{\text{Merge operation}}$

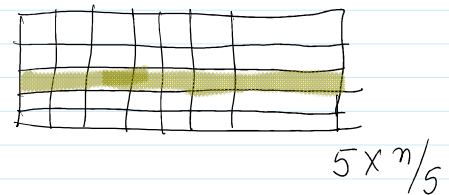


Exercise: Prove this recursion gives  $T(n) = O(n)$ .

$n$  elems

$O(n)$  Step 1: Construct  $5 \times \frac{n}{5}$  array

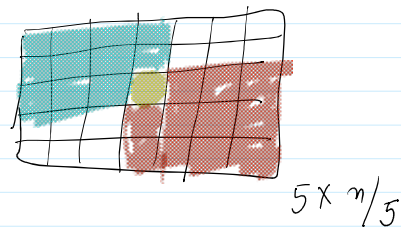
$O(n)$  Step 2: Sort each coln of this array



$T(\frac{n}{5})$  Step 3: Recursively find the median of the column-medians.

Claim: This returned median of medians is a good pivot.

# elems  $<$  median of median is  
at least  $\geq \frac{n}{10} \times 3 = 30\% \cdot n$



### Takeaways on D & C

- (1) Break pb into smaller subproblems
- (2) Recursively solve each subproblem
- (3) Combine all subprob solns to obtain soln to orig prob

Examples: Sorting, Max-difference, Median

### Dynamic Programming

Idea: Solve large pbs by using solns to smaller pbs.

(1) Define subproblem interval  $i, j, \dots$   $\leftarrow$  Similar to Induction Hypothesis

(2) Solve the subproblems & store its soln in a array  $M[i, j, \dots]$

(3) Use soln of subproblems to solve current problem  $\dots \uparrow \dots$  no interval table...

(2) solve the subproblems  $\dots$   $\underbrace{[1, 0, \dots]}$

(3) Use soln of subproblems to solve current problem ↑  
soln could be integer, tuple

(Similar sounding to D & C but subproblems more interleaved,  
rather than being disjoint)

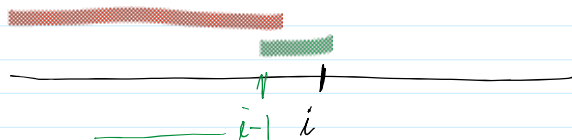
### Example 1: Longest Contiguous Sum

$n$  numbers  $A[0, \dots, n-1]$  ← could be +ve or -ve

Find a subinterval  $\{x, x+1, \dots, y\}$  to  $\max \sum_{i=x}^y A[i]$

E.g., 5, 15, -30, 10, -5, 40, 10  
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Define: Let  $M[i] =$  Sum of longest contig in  $A[0, \dots, i]$   
containing  $A[i]$ .



Plan: (1) Fill array  $M[]$  by induction

(2) Given array  $M[]$ , find the soln  $= \max_i \{M[i], 0\}$  ←  $\Theta(n)$  time

Claim: We can compute  $M[]$  in  $\Theta(n)$  time  $\Rightarrow$  overall  $\Theta(n)$  runtime

Pf by induction:

I.H. is that we have filled  $M[0, \dots, i]$  correctly

Base Case:  $M[0] = A[0]$

Ind Step:  $M[i] = \max \left\{ A[i], \underset{\substack{\uparrow \\ O(1) \text{ time}}}{A[i] + M[i-1]}} \right\}$

$\Rightarrow O(n)$  time to compute  $M[]$ .

## Extending to finding Longest Contig Seq

- Redefine  $M[i]$  to store not only sum of LCS but also whether  $M[i]$  took  $M[i-1]$  or not.
- In the end, when computing  $\max_i \{M[i], 0\}$ , trace back the soln.

## Example 2: Longest Common Subseq

Given 2 arrays  $A[0, \dots, n-1]$   
 $B[0, \dots, n-1]$

Find subsets of indices  $X, Y$  with  $|X| = |Y|$   
 and  $A[X_i] = B[Y_i]$

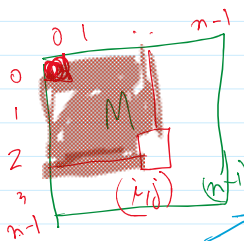
Eg:  $A \quad B \quad C \quad D \quad E \quad F \quad G$   
 $B \quad C \quad D \quad G \quad K \quad A \quad B$

$X = \{1, 2, 3, 6\}$   
 $Y = \{0, 1, 2, 3\}$

Define:  $M[i, j] = \text{Length of LCS using } A[0, \dots, i] \text{ \& } B[0, \dots, j]$

Base Case:  $M[0, 0] = \begin{cases} 1 & \text{if } A[0] = B[0] \\ 0 & \text{otherwise} \end{cases}$

$M[i, 0] = \begin{cases} \end{cases}$   
 $M[0, j] = \begin{cases} \end{cases}$



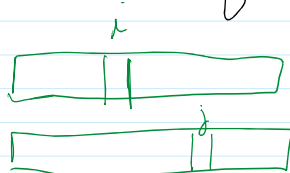
2-d array

$$M[i, j] = \begin{cases} 1 + M[i-1, j-1] & \text{if } A[i] = B[j] \\ \max \{ M[i-1, j], M[i, j-1] \} & \text{otherwise} \end{cases}$$

← if we match last numbers

o.w.

we need to drop at least one of  $A[i]$  or  $B[j]$ .



Time =  $\Theta(n^2)$  since  $O(1)$  per entry

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