

COL 351:

Analysis and Design of Algorithms

Lecture 24

Divide and Conquer

1. **Divide the main problem into smaller subproblems.**
2. **Solve the sub-problems recursively**
3. **Combine**

Quick Sort

Worst Case = $O(n^2)$
if we pick PIVOT naively

5	18	16	3	6	2	7	4
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List L

5

pivot

3	2	4
---	---	---

L1 = " ≤ 5 "

18	16	6	7
----	----	---	---

L2 = " > 5 "



5

pivot

2	3	4
---	---	---

Sorted L1

6	7	16	18
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Sorted L2

2	3	4	5	6	7	16	18
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1. Divide into subproblems

2. Solve the sub-problems recursively

3. Combine

Quick Sort Variations

1. Deterministic Quick Sort:

We take Pivot to be Median, i.e. $\left(\frac{n}{2}\right)^{th}$ element in SORTED list L.

2. Randomized Quick Sort:

We take Pivot to be a RANDOM element of the list L.


$$T(n) = 2 T(n/2) + \text{Time to find Median}$$

Deterministic Quick Sort

DetQuickSort(L)

x = Median of list L ; /* pivot is Median*/

Initialise $L1$ and $L2$ to be empty lists;

For each ($y \in L \setminus x$):

 If ($y \leq x$) : $L1.append(y)$;

 If ($y > x$) : $L2.append(y)$;

Return $DetQuickSort(L1) \circ x \circ DetQuickSort(L2)$;

How efficiently
can we find
median?



New Problem: Computing k^{th} -smallest element

Given: List L of size n and an integer $k \in [1, n]$.

Find: The element at **index** k after we **sort** the list L .

Example:

$L = [77, 33, 88, 66, 44, 11, 22, 55]$

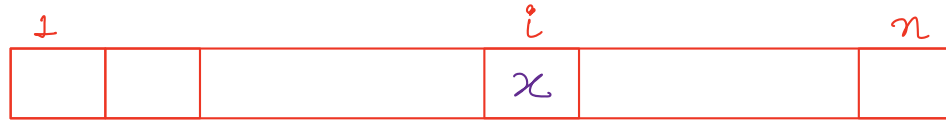
If $k = 2$ then we need to return 22.

Sorted L :

11	22	33	44	-	-	-	88
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Computing k^{th} -smallest element

Sorted L



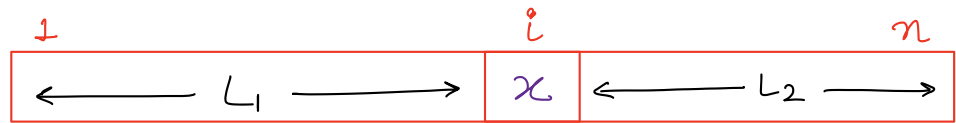
Pick an element x from L

$$i = \text{Rank}(x)$$

How to find x ?
SEE Next Pg.

$$L_1 = (L - x)_{\leq x}$$

$$L_2 = L_{> x}$$



If $k < i$

Search(L_1, k)

If $k = i$

STOP

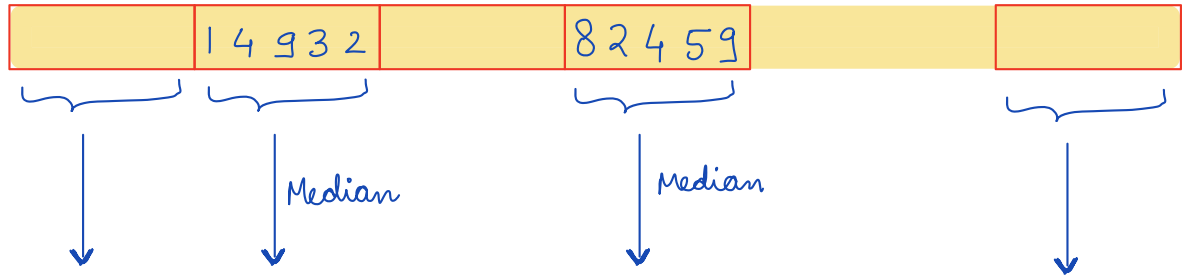
If $k > i$

Search($L_2, k - i$)

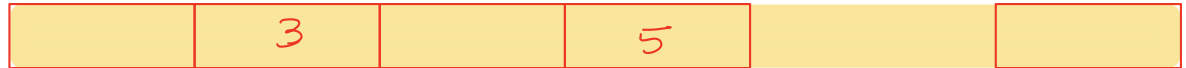
How TO FIND GOOD x ?

$\lceil n/5 \rceil$ chunks of size 5

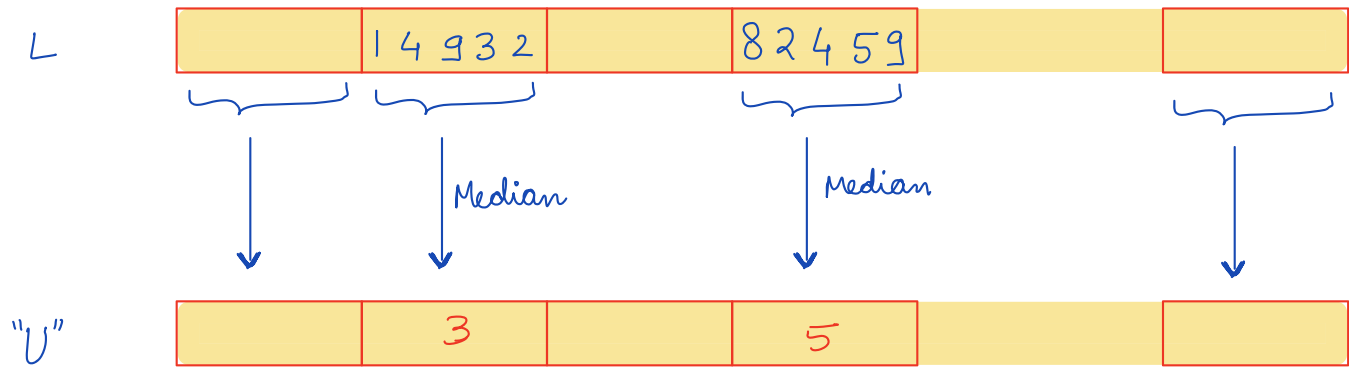
Unsorted L



New List " U "



$$x = \text{Median}(U)$$



CLAIM: $\text{Rank}(x = \text{Median of } U) \in \left[\frac{3n}{10}, \frac{7n}{10} \right]$

Proof:

In U, $n/10$ elements are larger than x

\Rightarrow In L, $3n/10$ elements are larger than x

$$\Rightarrow |L_1| \leq \frac{7n}{10}$$

Similarly, $|L_2| \leq \frac{7n}{10}$

Computing k^{th} -smallest element

Search(L, k)

1. Divide L into $\lceil n/5 \rceil$ groups each of size 5.
2. U = List containing medians of all $\lceil n/5 \rceil$ groups.
3. $x = \text{Order}(U, \lceil n/10 \rceil)$.
4. Rank = position of x in sorted L .
5. If (Rank = k) return x .
6. If (Rank > k):
 L_1 = Elements of $L \setminus x$ smaller than x
return *Search*(L_1, k).
7. If (Rank < k):
 L_2 = Elements of $L \setminus x$ larger than x
return *Search*($L_2, k - \text{Rank}$).

Steps 1-3: $O(n) + T(n/5)$

Steps 4-5: $O(n)$

Steps 6-7: ? $T(7n/10)$

Note: $n/10$ elements in U are $\geq x$.

So,
at least $3(n/10)$ elements in L are $\geq x$.

Therefore, $|L_1| \leq 7(n/10)$

Similarly, $|L_2| \leq 7(n/10)$

Time complexity follows the relation

$$T(n) \leq T(n/5) + T(7n/10) + cn$$

SUBSTITUTE

$$T(n) \leq \alpha n$$

$$\underline{\underline{RHS}} \quad \left(\frac{\alpha n}{5} + \alpha \frac{7n}{10} + cn \right) \leq \alpha n$$

$$\frac{9n}{10} \alpha + cn \leq \alpha n$$

$$\Rightarrow \alpha = 10c$$

Computing k^{th} -smallest element

Lemma: The k^{th} smallest element of a list L of size n is computable in $O(n)$ time.

Corollary: The Median of a list L of size n is computable in $O(n)$ time.

Time complexity of **Deterministic Quick Sort** follows the relation

$$T(n) \leq 2T(n/2) + cn$$

Randomized Quick Sort

RandQuickSort(L)

x = Random element of list L ;

Initialise $L1$ and $L2$ to be empty lists;

For each ($y \in L \setminus x$):

 If ($y \leq x$) : $L1.append(y)$;

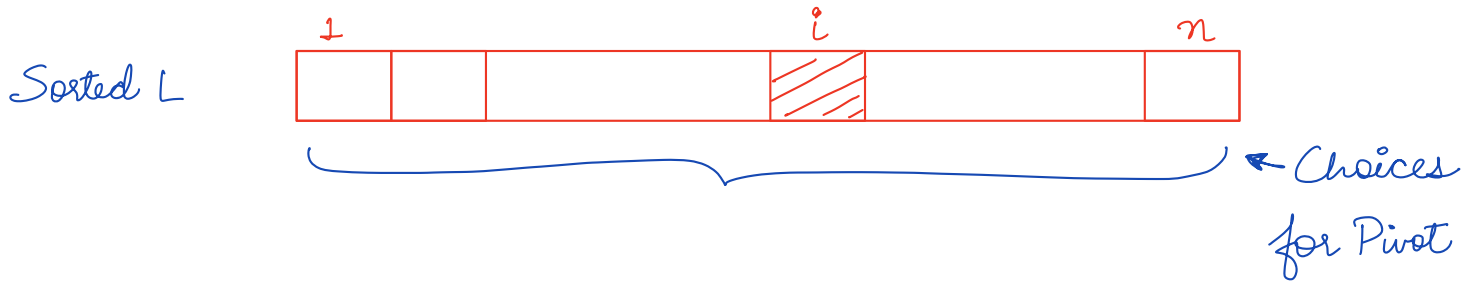
 If ($y > x$) : $L2.append(y)$;

Return $RandQuickSort(L1) \circ x \circ RandQuickSort(L2)$;

EXPECTED
TIME TO SORT?



$$\text{Expected time} = \frac{1}{n} \sum_{i=1}^n \left(E(T(i-1)) + E(T(n-i)) \right) + cn$$



If Pivot has rank i then

$$\text{size}(L_1) = i - 1$$

$$\text{size}(L_2) = n - i$$

Homework: What is $E(T(n))$?