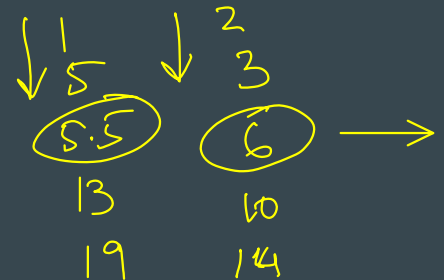


0. Preprocess input
1. Recursively solve  $\times$  <sup>one/many</sup> subproblems (same problem on a smaller instance)
2. Use their answers to solve for given input

# CSE525 Lec4: Recursion

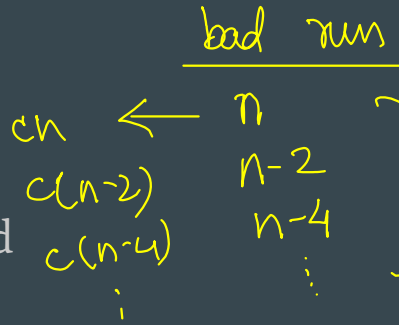
...

Debajyoti Bera (M21)

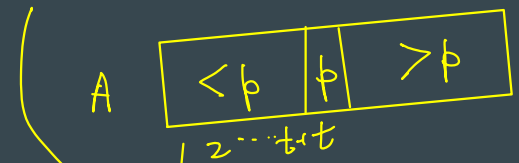


# Select(A,k)

Naive solution: Sorting based



$\Theta(n)$  recursive calls



- p is the t-th smallest element in A
- if  $k = t$ , return p
- if  $k < t$ ,

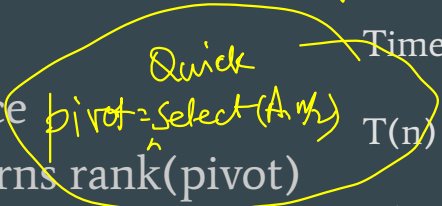
Given an array  $A[1..n]$  and an integer  $k \leq n$ , return the  $k$ -th small element in A.

QuickSelect(A,  $\frac{n}{2}$ ):

Won't work

QuickSel:  
(A[1...t-1], k)

1. If A is small, brute force
- 1.5  $r = \text{partition}(A)$  // returns rank(pivot)
2. If  $k < r$ : return QuickSelect(A, k)
3. If  $k = r$ : return A[k]
4. If  $k > r$ : return QuickSelect(A,           )



Time complexity recurrence:

$T(n) = \text{_____}$

$T(\text{small}) = \text{brute force}$

$T(n) = O(n)$  // time to partition

+ \_\_\_\_\_ // time during recursion

best way to choose pivot  
is median = Select(A, n/2)

What is the best way to choose pivot?

Alternative 1.5.

MomSelect(A, k) : // |A| = n

0. base case

2. r = partition(A, pivot = mom)

3. if k < r : return MomSelect(A[1..r-1])

4. 5, as before, using MomSelect(...)

# Median of (5) Median

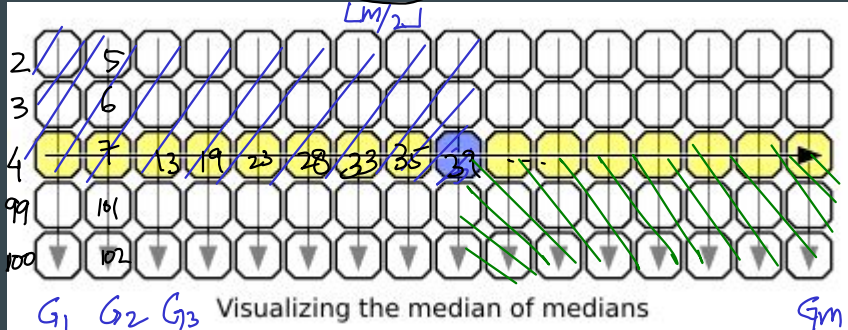
Pivot selection

```

m ← [n/5]
for i ← 1 to m
    M[i] ← MEDIANOFFIVE(A[5i-4..5i])  // Brute force!
mom ← MOMSELECT(M[1..m], [m/2])  // Recursion!
    
```

Brute force/naive

Use median of medians (mom) as pivot!



**Lemma:** At least 3 elements of subarray

A[5i-4 ... 5i] are ≤ mom.

n = 100 median has rank 50  
mom has rank [30, 31, ..., 70]

**Lemma:** At least 3\*(n/5)/2 elements of A

are ≤ mom.

rank(x) = #elements ≤ x

**Lemma:** At least 3n/10 elements of A are

> mom.

(#elems < mom) ≤ n - 3n/10 = 7n/10

Q: Final recurrence?

(#element > mom) ≥ 3⌈n/2⌉  
= 3⌈n/5⌉/2  
≥ 3n/10

- Find median of slots
- Find median of medians
- Recursively solve using mom as pivot.

Q: Solve recurrence.

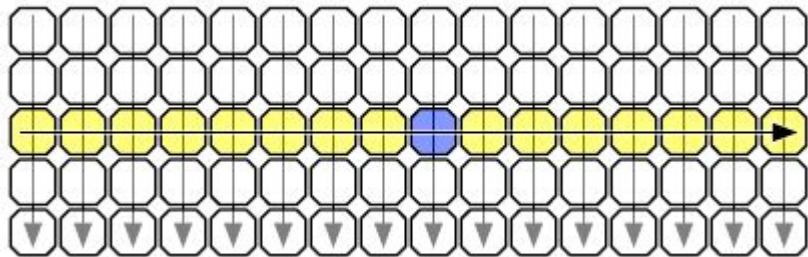
(#elements ≤ mom) ≥ 3⌊n/2⌋ = 3⌊n/5⌉/2 ≥ 3n/10

∴ rank(mom) < 7n/10

∴ rank(mom) ≥ 3n/10

# Median of (5) Median

```
m ← ⌊n/5⌋  
for i ← 1 to m  
    M[i] ← MEDIANOF FIVE(A[5i-4..5i])  ⌌Brute force!⌌  
mom ← MOMSELECT(M[1..m], ⌊m/2⌋)  ⌌Recursion!⌌
```



Visualizing the median of medians

Q: Final recurrence ?

- Find median of slots
- Find median of medians
- Recursively solve using mom as pivot.

Q: Solve recurrence.

Use median of medians (mom) as pivot !

**Thm:**  $3n/10 \leq \text{rank}(\text{pivot}) \leq 7n/10$

Groups of Three

$$T(n) \leq O(n) + T\left(\frac{n}{3}\right) + T\left(\frac{2n}{3}\right)$$

$$\text{rank}(\text{pivot}) \in \left\{ \frac{n}{3}, \frac{2n}{3} \right\}$$

33% 67%

Quick

$T(\dots)$  is an increasing fun.

# Select(A,k) using MOM

$$\frac{3n}{10} \leq r \leq \frac{7n}{10} \quad \frac{7n}{10} \geq n-r \geq \frac{3n}{10}$$

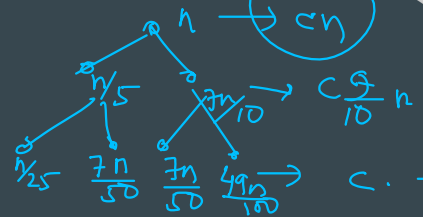
Use median of medians (mom) as pivot!  $3n/10 \leq \text{rank}(\text{pivot}) \leq 7n/10$

Mom Select(A,k):

$$T(n) = \left\lceil \frac{n}{5} \right\rceil \cdot O(1) + \overset{\text{computing median of MOM}}{T\left(\left\lceil \frac{n}{5} \right\rceil\right)} + \overset{\text{partition}}{O(n)} + \max\{T(r), T(n-r)\}$$

1. If A is small, brute force
2. M = ComputeMOM(A) // pivot selection
3. r = partition(A,M) // returns rank(pivot)
4. If k < r: return ~~Quick~~ <sup>Mom</sup> Select(A, k)
5. If k = r: return A[k]
6. If k > r: return ~~Quick~~ <sup>Mom</sup> Select(A, \_\_)

$A[1 \dots r-1]$   
 $A[r+1 \dots n]$



$$c \cdot \frac{81}{100} n = \left(\frac{9}{10}\right)^2 n$$

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

Conv. series  $\left\{ \frac{n}{5} + \frac{7n}{10} = \frac{9n}{10} < n \right.$

# Solving Recurrence

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

$$T(n) \leq O(n) + \max_{\{t:0 \dots n-1\}} T(t)$$

Why median of 5 ?

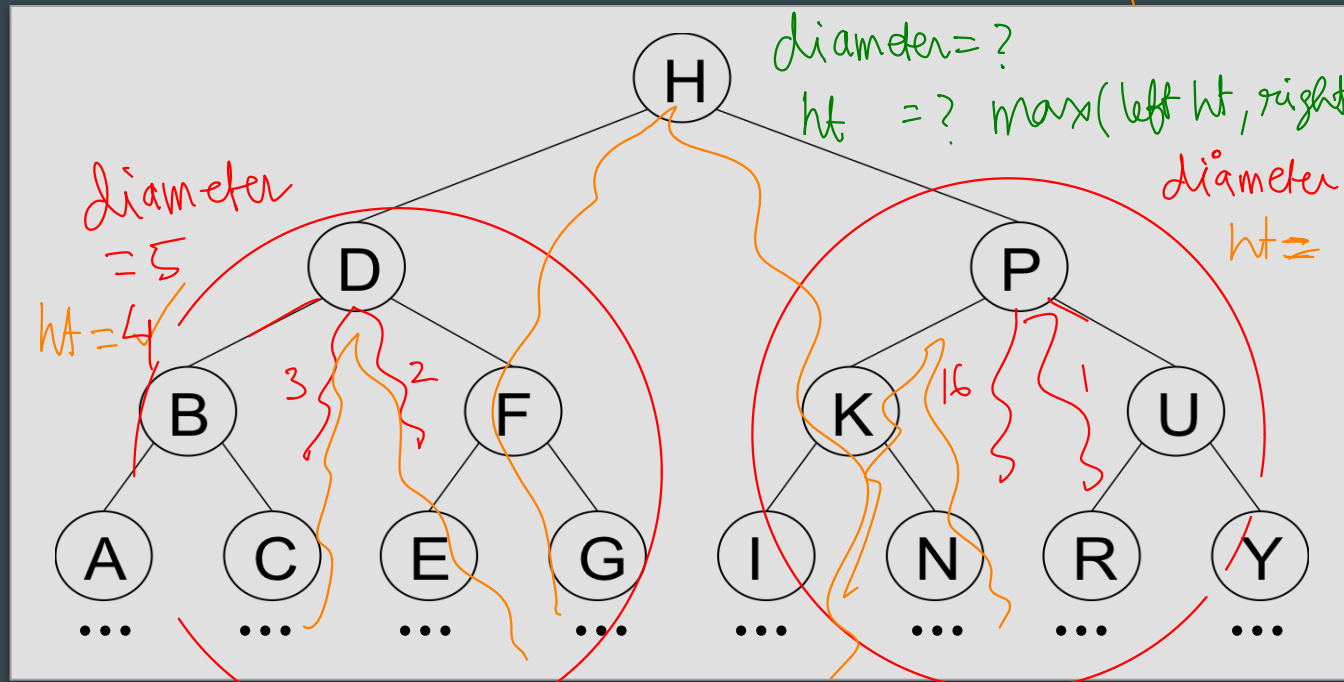
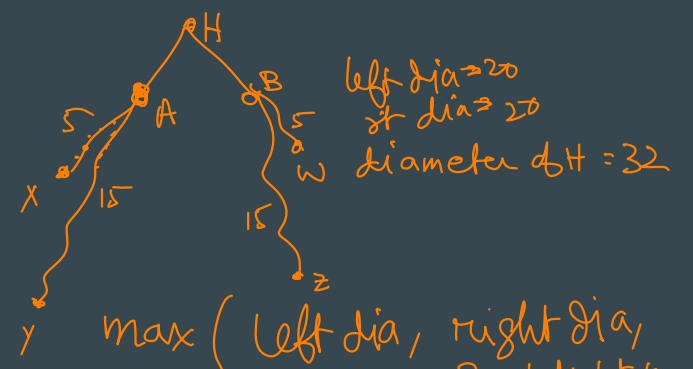
# Practical implementations

- Quickselect (1961) in most libraries (with pivot selection heuristics)
- IntroSelect : Perform Quickselect and observe behaviour. If Quickselect appears slow, switch to IntroSelect
- Martinez + (2002) : Switch to sorting when array size becomes small
- Floyd Rivest randomized selection : 2 pivots and 3 partitions
- Chen (2015) : Groups of 2, 3, 4 are possible (needs to be done cleverly)
- Alexandrescu (2017) : Faster in practice. Uses median of 3 medians of three.

Diameter(G) = longest shortest path (u,v)  
 (Diameter of a Tree, Ht of a tree)

Recursively compute ...

Diameter (v) = diameter of subtree rooted at v



diameter = ?  
 ht = ?  $\max(\text{left ht}, \text{right ht}) + 1$

diameter = 5  
 ht = 4

diameter = 17  
 ht = 15