

# Order Statistics: MEDIAN

Note Title

10/8/2007

if list size is odd,  
median is  $\lceil \frac{n}{2} \rceil$ th element  
in a sorted version of the list.

1 2 3 4 5 6 7  
2 2 7 1 4 4 3

if list size is even,  
then there are two medians:  
lower median:  $\lceil \frac{n}{2} \rceil$ th element  
in a sorted version  
of list.

upper median:  $\lceil \frac{n+1}{2} \rceil$ th element  
in a sorted version  
of list.

1 2 3 4 5 6

2 7 4 1 6 5

When we talk about **median**, we will be talking about the '**lower median**

or  $\left\lceil \frac{n}{2} \right\rceil^{\text{th}}$  element in a sorted version of the list.

(list size even or odd)

How to find the median?

- ① Sort list with Merge Sort.
- ② Return the  $\lceil n/2 \rceil$ th element.

Runtime in terms  
of comparisons :  $n \log n + c$

Can we do better?

## Inspiration from Min? Max?

- If we looked for minimum value, discarded it, looked for next minimum value, etc.  $n/2$  times we would get median.
- How much time would this take?

$O(n^2)$



- This is as bad as sorting!
- Using divide + conquer did not lead to any improvements in Min or Max, but did lead to some improvement for MinMax.

What if we try divide and conquer?

Is median finding easy when the list size is small?

When list size = 3  
( $n = 3$ )

median can be found with this algorithm:

- ① Find min. Discard.
- ② Find max. Discard.
- ③ Remaining element is median!

This is  $2(n-1) = 4$  comparisons.

Can be done in  $\frac{3n}{2} - 2 \approx \underline{3 \text{ comparisons.}}$   
(min max)

Note :  $\left. \begin{array}{l} a R b \\ b R c \\ c R a \end{array} \right\}$  We need only know these three relations (comparisons).

## Median Finding Divide and Conquer \*

- ① Split list into sublists all of size 3.
- ② Find median of each sublist.
- ③ Take list of medians and find the median of that list.

Is this correct??

\*Thanks Evan!

Let's try this algorithm out:

1 3 5 2 4 6 7 8 9

actual median: 5 Median-3

median computed by algorithm: 4

Split into sublists

1 3 5      2 4 6      7 8 9

Median: 3      Median: 4      Median: 8

resulting list of medians: 3 4 8

median  
computed by algorithm: 4

"Median of medians" approach does not work!

But can we use the median of medians for something?

example:

Related question: Can we verify that we found a median?

2 6 5 12 11 10.

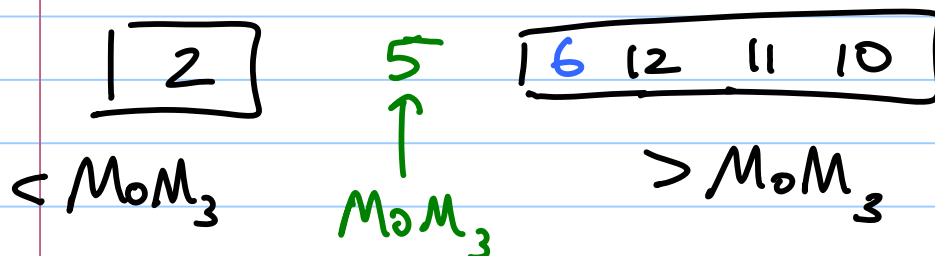
actual median: 6

"median of medians" : 5

(when breaking list into 3-element sublists). Let's call this  $MoM_3$ .

IDEA: use  $MoM_3$  as a pivot!

- Partition list based on pivot



- where is median? It is in the BIGGER sub list.



Let's use this fact to define a recursive median-finding algorithm.

Let's define

**SELECT**(list, i)

// returns  $i$ th value in the sorted version of the list.

what would be

(The list is not actually sorted!)

So to find median, we

call **SELECT**(list,  $n/2$ )

(assume  $n$  even.)

**SELECT**(list, 1) finds min.

**SELECT**(list,  $n$ ) finds max.

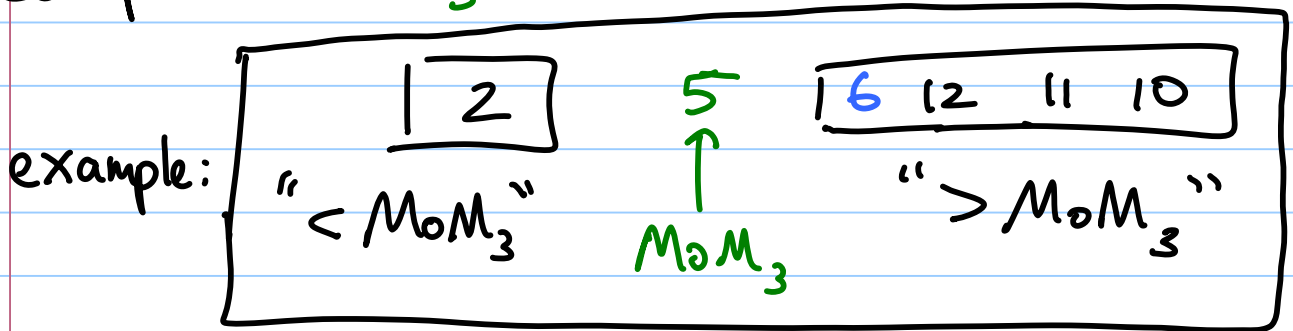
So, what happens when we call

**SELECT**( $\{2, 6, 5, 12, 11, 10\}$ ,  $\frac{6}{2}$ ) ?  $\Rightarrow 6$

Example input: 2 6 5 12 11 10

**SELECT** (list,  $i$ ) {  
//  $i$  = position of desired value.

① Compute  $MoM_3$ .



② Partition around  $MoM_3$  and  
let  $pos_{MoM_3}$  = position of  $MoM_3$  after  
partition.

③ If  $i > pos_{MoM_3}$ ,  
call **SELECT** (">  $MoM_3$ " list,  $i - pos_{MoM_3}$ )

If  $i < pos_{MoM_3}$ ,  
call **SELECT** ("<  $MoM_3$ " list,  $i$ )

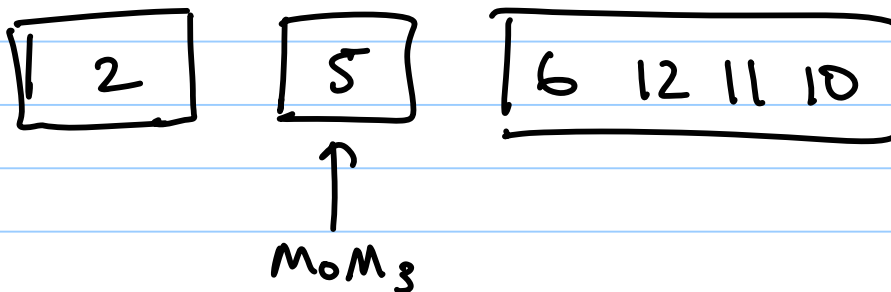
If  $i == pos_{MoM_3}$ ,  
return  $MoM_3$ .

Note: We are not  
necessarily looking  
for the median  
in the recursive  
call!

Concrete example:

① SELECT ( $\{2, 6, 5, 12, 11, 10\}$ ,  $\frac{6}{2}$ )

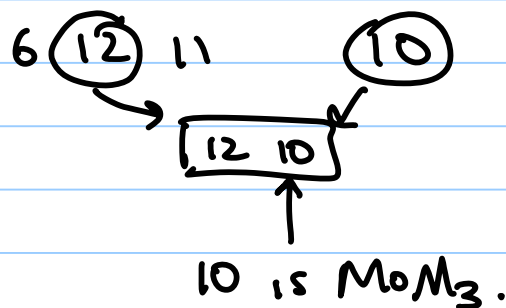
$i$  = position of desired value  
 $= \frac{6}{2} = 3$  initially

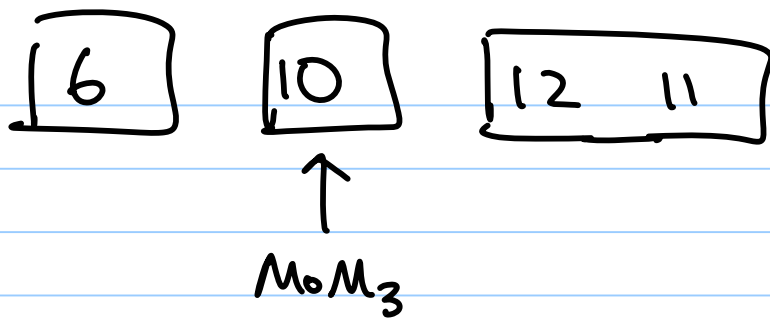


$pos_{MoM_3} = \underline{2}$

( $i > pos_{MoM_3}$ ), so

② SELECT ( $\{6, 12, 11, 10\}$ ,  $3 - 2$ )





$$i = 1$$
$$pos_{mom_3} = \underline{2}$$

$$i < pos_{mom_3},$$

so  
③ SELECT ( {6}, 1 )

$$mom_3 = 6$$

$$pos_{mom_3} = 1$$

$i == pos_{mom_3}$ , so return 6!

**SELECT** (list,  $i$ ) {

//  $i$  = position of desired value. x x x | x x x

① Compute  $MoM_3$ .

↳ by calling **SELECT** (list of medians,  $\frac{n}{6}$ )

Found  
w/ Median-3

$\frac{n}{3} \cdot \frac{1}{2}$

example:  $MoM_3$  of {2, 6, 5, 12, 11, 10}  
is **SELECT** ({5, 11}, 1) = 5

② Partition around  $MoM_3$  and  
let  $pos_{MoM_3}$  = position of  $MoM_3$  after  
partition.

③ If  $i > pos_{MoM_3}$ ,  
call **SELECT** (">  $MoM_3$ " list,  $i - pos_{MoM_3}$ )

If  $i < pos_{MoM_3}$ ,  
call **SELECT** ("<  $MoM_3$ " list,  $i$ )

If  $i == pos_{MoM_3}$ ,  
return  $MoM_3$ .

What is the RT of ① and ②?

① Compute  $\text{Mom}_3$

- Time to find medians  
of each sublist =

3 comparisons  $\frac{n}{3}$  times =  $O(n)$

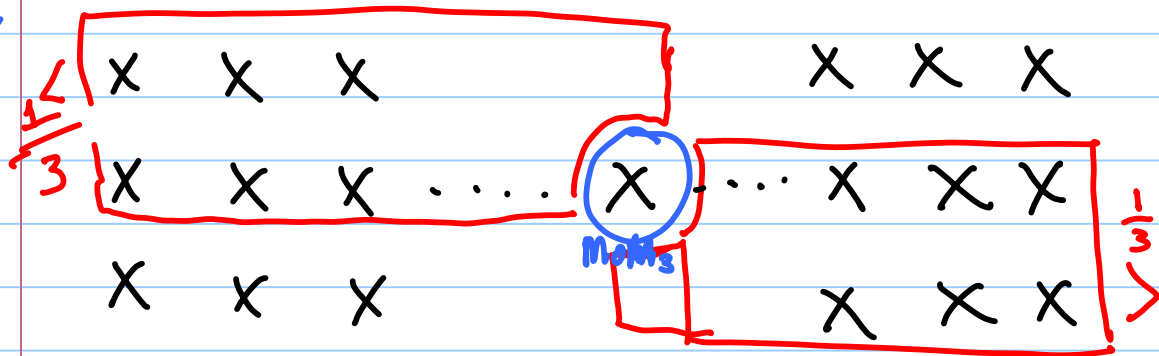
- Time to compute  
 $\text{Mom}_3$  from list of medians  
of size  $\frac{n}{3}$  done recursively:  
 $T(\frac{n}{3})$

② Time to partition:  $O(n)$

But how hard is it to  
compute step ③ — the  
main recursive call?

Imagine you could line up "towers of 3", sorted by medians. (Not actually sorted, just described conceptually as sorted!!)

What is the run time of ③?



What do we know?

sorted  
towers  
of 3.

Dead center is the median of medians.

Which  $x$ 's are definitely less than  $mom_3$ ?

Which are definitely greater?

What about others?

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

$$T(n) = \underbrace{\text{time to compute MoM}_3}_{\text{time to find medians + of each sublist}} + \underbrace{\text{time to partition}}_{\downarrow O(n)} + T\left(\frac{2n}{3}\right)$$

time to  
find medians +  
of each sublist

↓  
 $O(n)$

time to  
compute  
 $\text{MoM}_3$   
from list  
of medians  
list size:  $\frac{n}{3}$   
done recursively  
 $T\left(\frac{n}{3}\right)$

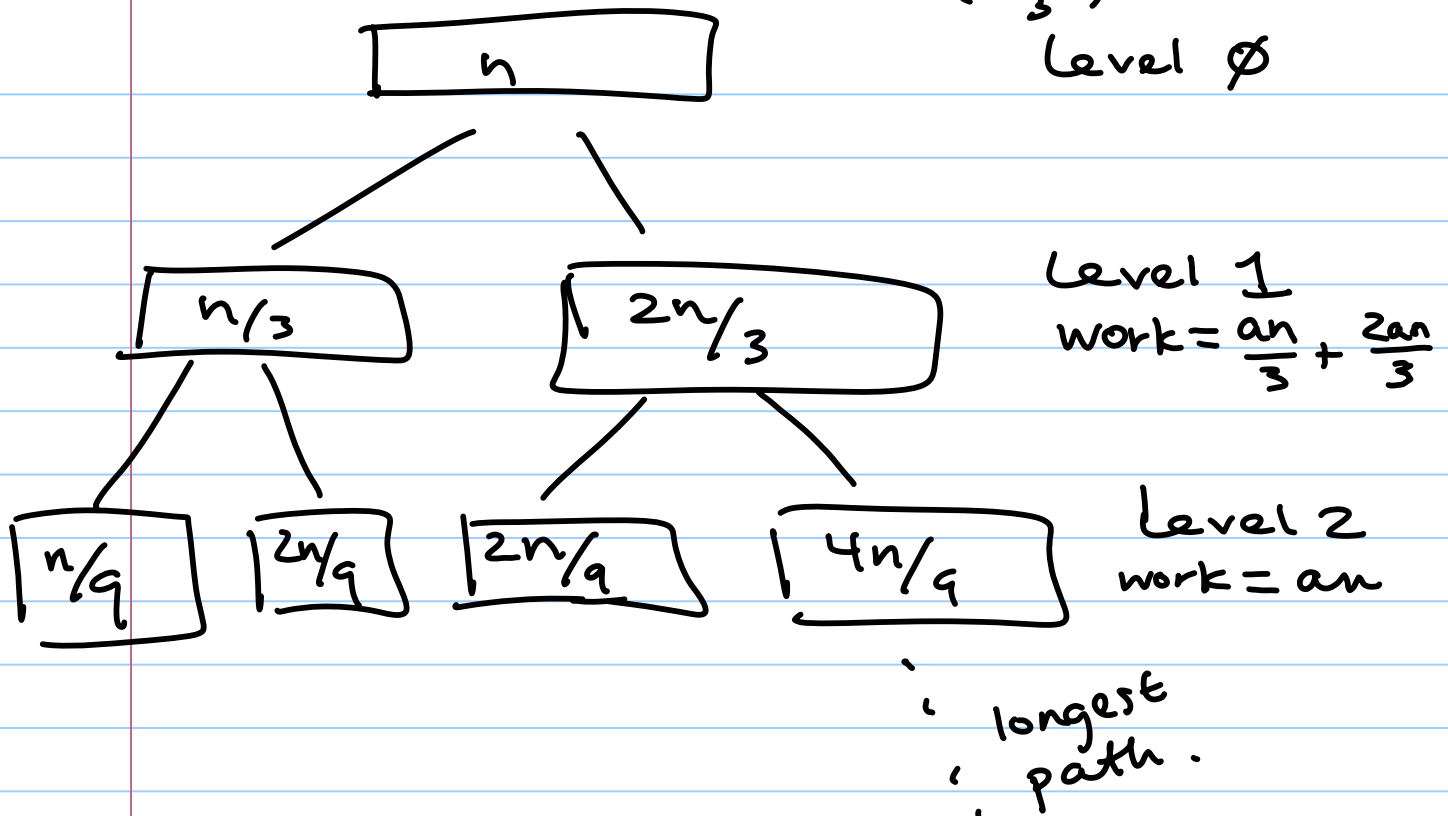
$$T(n) = O(n) + T\left(\frac{n}{3}\right) + O(n) + T\left(\frac{2n}{3}\right)$$

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

Let's solve this...



$$T(n) = T\left(\frac{n}{3}\right) + T\left(\frac{2n}{3}\right) + an$$



$$\boxed{1} \quad \text{Level } m.$$

$$m = \log_{3/2} n$$

$$T(n) \leq \sum_{i=0}^{\log_{3/2} n} an$$

$$= an (\log_{3/2} n + 1)$$

$$T(n) \in O(n \log n)$$

# Exam

Do not make any change to the exam itself.

Write regrade request on separate sheet of paper explaining why something you lost points for was correct.

Partial credit is not a negotiating point.

We reserve the right to review other questions to look for grading deductions that were missed.

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Show of hands:

Friday 3PM Review to go over exam?

Median = 81