

Topics: 1- K sorted array  
2- Heap Sort  
3- k places apart

4- kth largest element  
5- running median

each array is sorted  
a {2, 3, 11, 15, 20}<sup>5</sup>  
b {1, 5, 7, 9}<sup>4</sup>

c {0, 2, 4}<sup>3</sup>

k array n elements  
d {3, 4, 5, 6, 7, 8}<sup>6</sup>

X = n x k  
e {-2, 5, 10, 20}<sup>4</sup>

X log k  
TC:  $O(k + (X-k) \log k)$  (II)  
{-2, 0, ..., 20}<sup>22</sup>



min-heap

(k)

add remove  
 $\log(k)$

X total TC:  $O(X) + O(X \log X)$  (I)

merge after each other

sort quick sort

$2n + 3n + \dots + kn$

$n(2 + 3 + \dots + k)$

$n \times \frac{k(k+1)}{2} \sim$

X log X

$n \log k$   
 $n \times k \times k$

-2, 2, 3, 9, 10, 11

$\log(n) + \log(n-1) + \dots$

$\log(1)$

create heap

TC:  $O(n) + O(n \log n)$

SC:  $O(n)$

min-heap



{3, 9, -2, 10, 11, 2}

Sort using heap in increasing order.

How?

sort in increasing  
small to large

← use max heap

decreasing ← min heap

Quiz

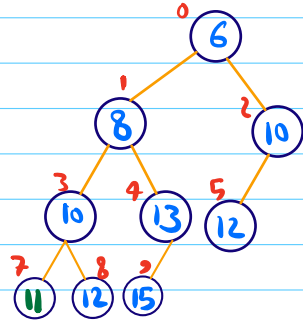
## Heap Sort

\* just for depiction

\* actual heapify operation  
happens only on array  
SC:  $O(1)$

step 1  
heapify

TC:



convert by level order

①  
②

0 1 2 3 4 5 6 7 8 9 10  
13 10 15 8 12 12 10 6 11

$O(n) + \log n + \log(n-1) + \log(n-2)$

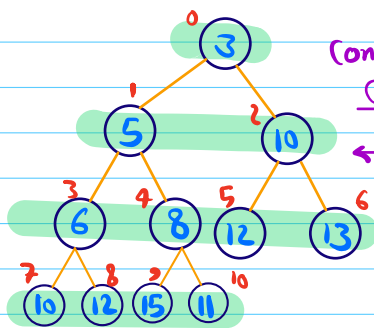
remove root from heap }  $\log(n)$   
and readjust

build heap  
SC:  $O(1)$

step 2

Get & Remove  
min

TC:



convert by level order

①  
②

0 1 2 3 4 5 6 7 8 9 10  
3 5 10 6 8 12 13 10 12 15 11

TC:  $O(n + n \log n) = O(n \log n)$

SC:  $O(1)$

	TC	SC	stable?
Heap sort	$n \log n$	1	No → why?
merge sort	$n \log n$	$n$	Yes
quick sort	$n \log n$	$O(1)$	No

Comparison based sorts (i.e. not count sort) cannot be better (average case) than  $O(n \log n)$

Microsoft

All windows starting from 0

P2 Given an integer array,  $\forall i \geq (k-1)$ , find  $k$ th largest element from 0 to  $i$ .

bloom  
filter

$A = \{ \overset{0}{10}, \overset{1}{18}, \overset{2}{7}, \overset{3}{5}, \overset{4}{16}, \overset{5}{19}, \overset{6}{3}, \overset{7}{17} \}$   $k=3$

$\{ \underline{7}, \underline{7}, \underline{10}, 16, 16, 17 \} \leftarrow \text{ans}$

$n-k+1$

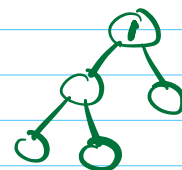
Quiz

$\{1, 2, 3, 4, 5\}$

1st 5  
2nd 4

3rd 3  
4th 2

5th 1



$\{ \overset{0}{10}, \overset{1}{18}, \overset{2}{7}, \overset{3}{5}, \overset{4}{16}, \overset{5}{19}, \overset{6}{3}, \overset{7}{17} \}$

idea 1

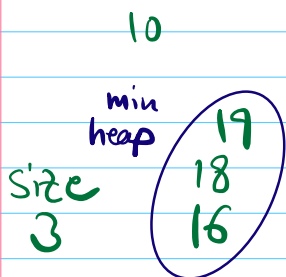
$$3 \log 3 + 4 \log 4 + \dots + n \log n \leq n^2 \log n$$

idea 2

binary search after sort for finding  $k$ th largest (HW)  
 $O(n \log n + k \log n) \sim O(n \log n)$

idea 3

optimized



build heap on first  $k$  items

ans.add(peaktop())

for  $i = k \rightarrow n-1$

if ( $A[i] \leq$  root of min heap) { // ignore  
else {

get Min() & remove

insert( $A[i]$ )

}  
output  $\leftarrow$  root of tree  $O(1)$   
is root of heap peaktop()

TC:  $O(k + (n-k) \log k)$

SC:  $O(k)$

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nearly sorted

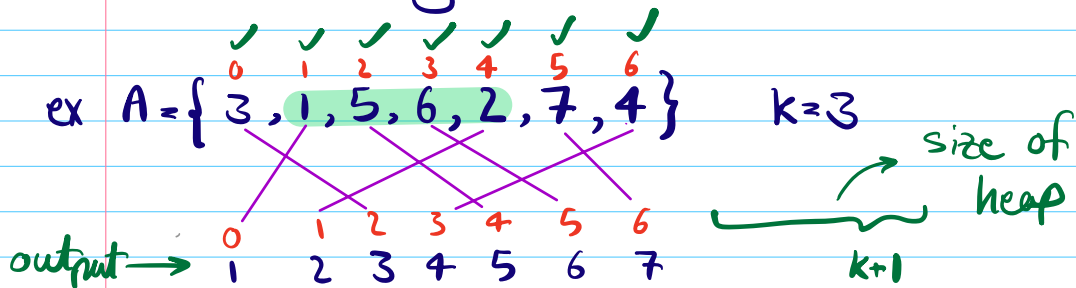
P4 Given an integer array  $A$  with  $n$  elements & an integer  $k$ . In  $A$ , every element is at max  $k$  distance away from its position in sorted order.  $|i-j| \leq k$

Sort the array.

$$k \leq 10^3$$

$$n \leq 10^5$$

$$k \leq n$$



idea  
pure  
sort

① TC:  $n \log n$

ex  $A = \{ 1, 2, 5, 6, 3, 7, 4 \}$   $k=3$

$\rightarrow O(k + (n-k) \log(k)) \sim O(n \log k)$  TC:  $O(n \log k)$  II

② using heap

TC:  $O(k)$

int

P5 Given a running stream of integers, find median of all elements, for each input.

Quiz

middle element in sorted order.

ex  $\{1, 2, 5, 4, 3\} \xrightarrow{\text{Sort}} \{1, 2, 3, 4, 5\}$

ex  $\{5, 10, 2, 3, 1, 4\} \xrightarrow{\text{sort}} \{1, 2, 3, 4, 5, 10\}$

$$\frac{3+4}{2} = 3.5$$

ex 9, 8, 17, 20, 25, 10, 5, 3 ...

Sorted array

9	8	17	20	25	10	5	3	...
9	8	8	8	8	8	5	3	
9	9	9	9	9	9	8	5	
	85	17	17	17	17	10	8	
			20	20	20	17	9	
			25	25	25	20	10	
						25	17	
							20	
							25	

output:

$O(2)$

$O(3)$

$O(4)$

$O(n)$

$O(n^2)$

idea1

idea2

idea3

8  
9  
17  
20  
25

8, 9, 17, 20, 25

$\sim n/2$

$\sim n/2$

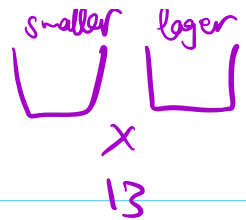
max heap of small item      min heap of large item

$(n)$

$n/2$ th largest item  
 $n/2$ th smallest item

for each  $X$  {

median =  $A[0]$



new number in stream is  $X$

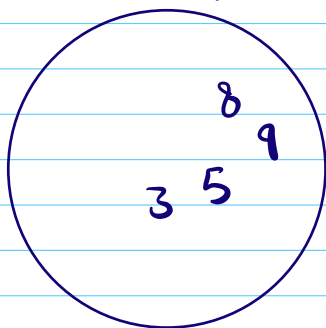
if ( $X \leq \text{median}$ ) { small items  
 insert  $X$  in maxHeap  
 if ( $\text{size of maxHeap} - \text{size of minHeap} > 1$ ) {  
 remove root from maxHeap  
 & insert to minHeap  
 }  
 }

else { // try adding in larger bag (min-heap)  
 insert  $X$  in minHeap  
 if ( $\text{size of minHeap} > \text{size of maxHeap}$ ) {  
 remove root from minHeap  
 & insert to maxHeap  
 }  
 }

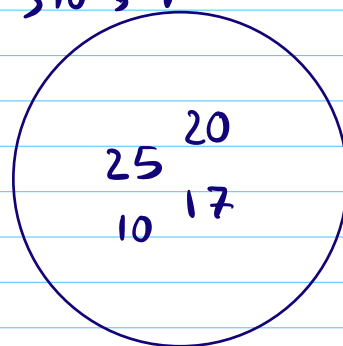
median = maxHeap.root  $\rightarrow$  ans.add(median)

}  
 check if ( $\text{maxHeap.size} + \text{minHeap.size} \neq 2$ )

bag of  
Smaller  
max heap



bag of  
larger  
min heap



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$TC : n \log(\frac{n}{2})$