

# Lecture 3 - Sorting (and searching)

Binary search ( $A[b:e]$  and  $v$ )

↓  
sorted

$$m = \frac{b+e}{2}$$

if ( $v == A[m]$ ) done!

if ( $v > A[m]$ ) BinarySearch ( $A[m+1:e], v$ )

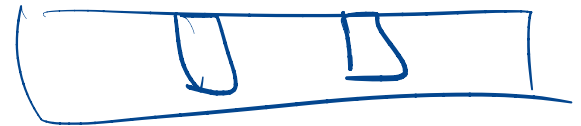
if ( $v < A[m]$ ) BinSearch ( $A[b:m-1], v$ )

$$T(n) = T(n/2) + \Theta(1) \Rightarrow T(n) = \Theta(\log n)$$

Ⓧ No search alg works faster than  $\Theta(\log n)$  by comparisons

Ternary search  $T(n) = 1 + T(n/3)$   $\Theta(\log_3 n) = \Theta(\log_2 n)$

$$m = \frac{b+e}{3} \quad n = \frac{b+e}{3}$$



val  $v$  vs  $A[m], A[n] \Rightarrow$  go accor to  $(|A| = \frac{n}{3})$

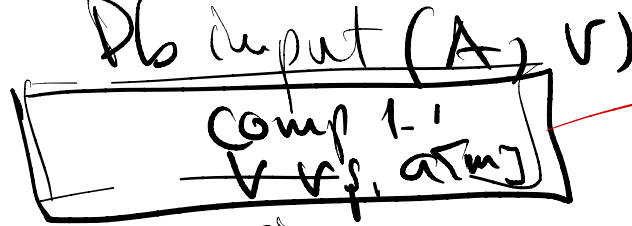
proof

alg A w/ comp

As a tree of decisions

#/done  $\geq$   $\frac{n+1}{2}$

$v = A[1]$   
 $v = A[2]$   
 $\vdots$   
 $v = A[n]$

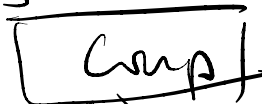
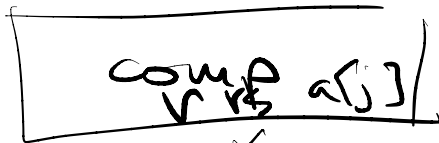


→ first comp  
 $a[2]$  vs  $a[3]$

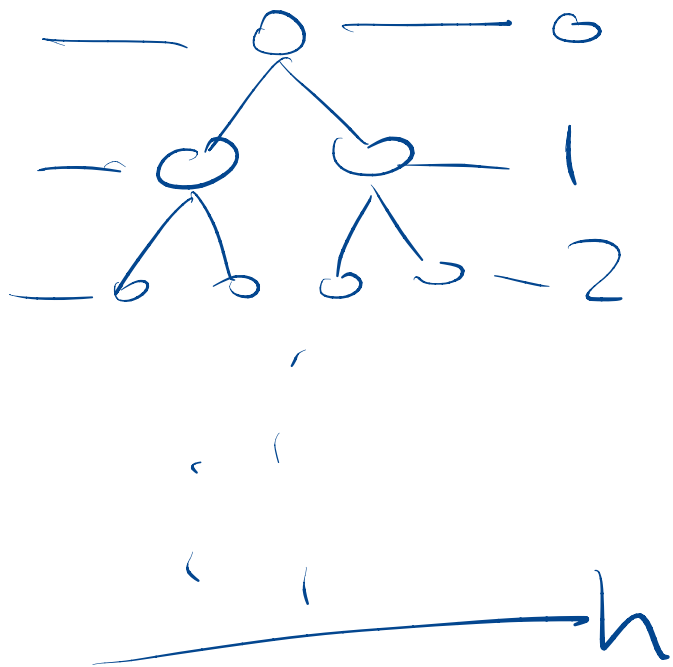
yes

no

binary tree



binary tree



depth  $h$  (#levels)

$$\max \# \text{leaves} \approx 2^{h+1}$$

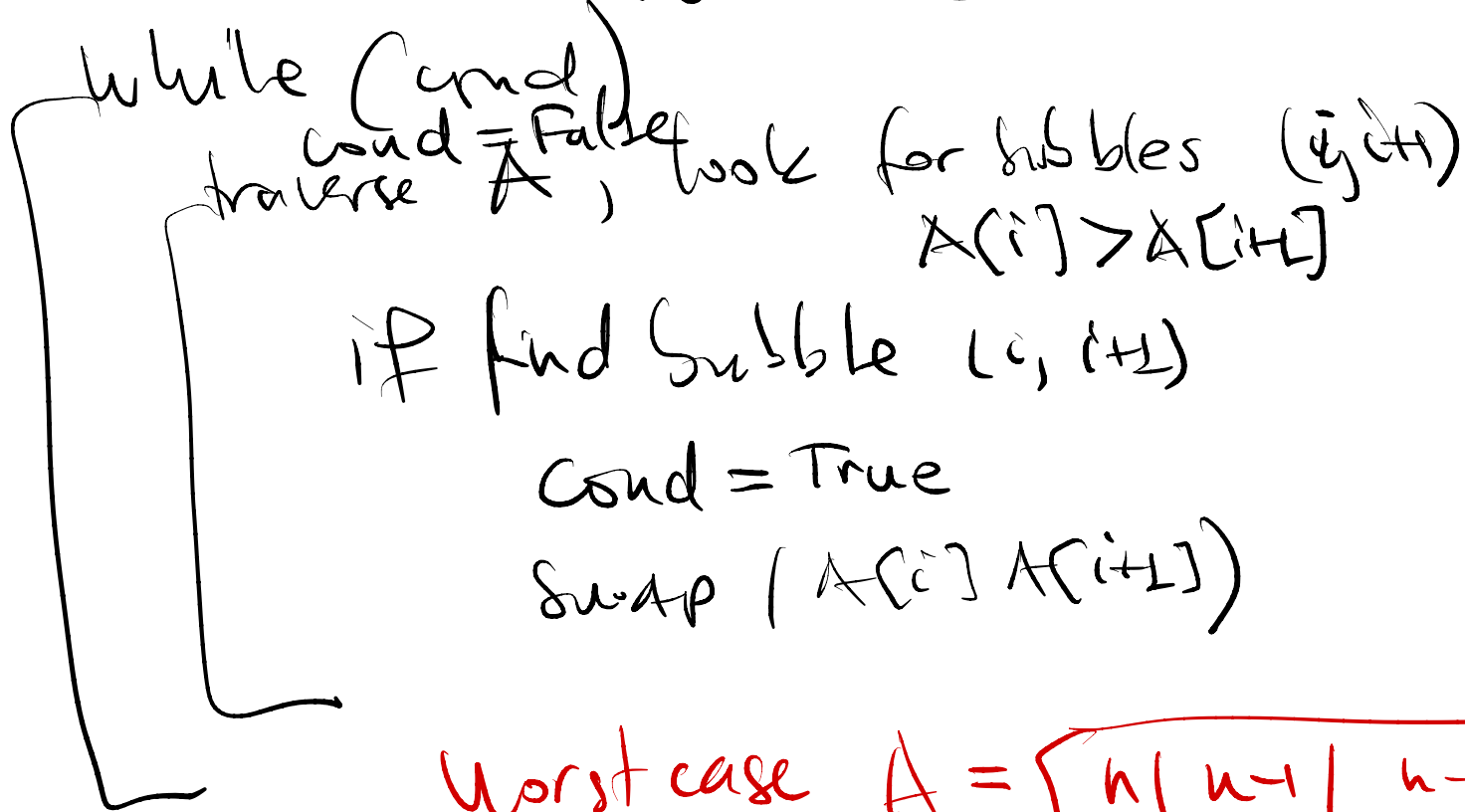
$$n+1 \leq 2^{h+1}$$

$$h \geq \Theta(\log n)$$

$\Rightarrow \Theta(\log n)$  At least one branch is

# Sorting Recap - (A not sorted)

Bubble Sort cond = True



Th  
no bubbles  
↓  
A sorted

Worst case  $A = [n | n-1 | n-2 | \dots | 1]$

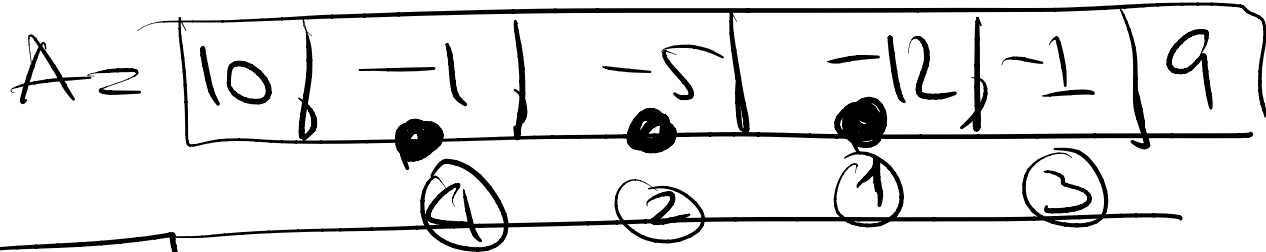
# comparisons

# bubbles  $\binom{n}{2} = \Theta(n^2)$

$i < j$   
 $A[i] > A[j]$

Best case:  $A = [1 | 2 | \dots | n]$   
avg:  $\Theta(n^2)$        $\Theta(n)$

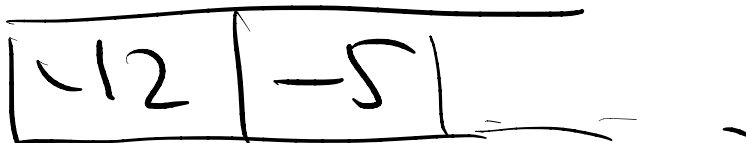
# Selection sort



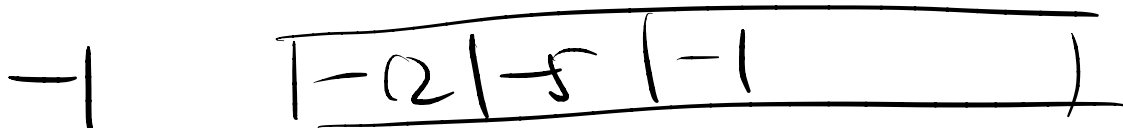
$n-1$  1) select min



$n-2$  2) select min -5  
(skip the used ones)



$n-3$  3) repeat



4)



until I finished  
all element (used)

$O(n^2)$  all the time

Insertion Sort • keep read-so-far SORTED  
(in input order)

- worst case  $\Theta(n^2)$  *A backwards*  
• insert next value  $\rightarrow$  SORTED

- best case  $\Theta(n)$

- avg case  $\Theta(n^2)$  *inside ALG*

1	2	3	4	5	6
1	5	8	20	49	...

next val = 9

Strategy 1: drag 9 in

1	5	8	20	49	9
---	---	---	----	----	---

bubble?  $\checkmark$

1	5	8	20	9	49
---	---	---	----	---	----

$\checkmark$  like.

1	5	8	9	20	49
---	---	---	---	----	----

$\checkmark$

Strategy 2: binary search  
make space

$\Theta(n \log n)$

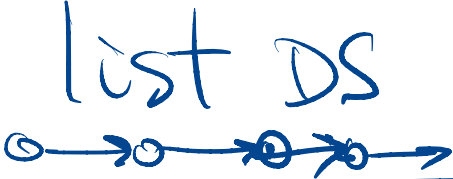
- bin-search  $\Rightarrow$  9 in pos 4

- makes space *more by 1*

1	5	8		20	49
---	---	---	--	----	----

- put 9 in

1	5	8	9	20	49
---	---	---	---	----	----

	list DS 	array-DS	BT-DS
finding the spot	$\Theta(n)$	BS <sup>*</sup> $\log(n)$	$\log(n)$ ?
insertion make space	$\Theta(1)$	$\Theta(n)$	$\Theta(1)$

# Insertion Sort with BST

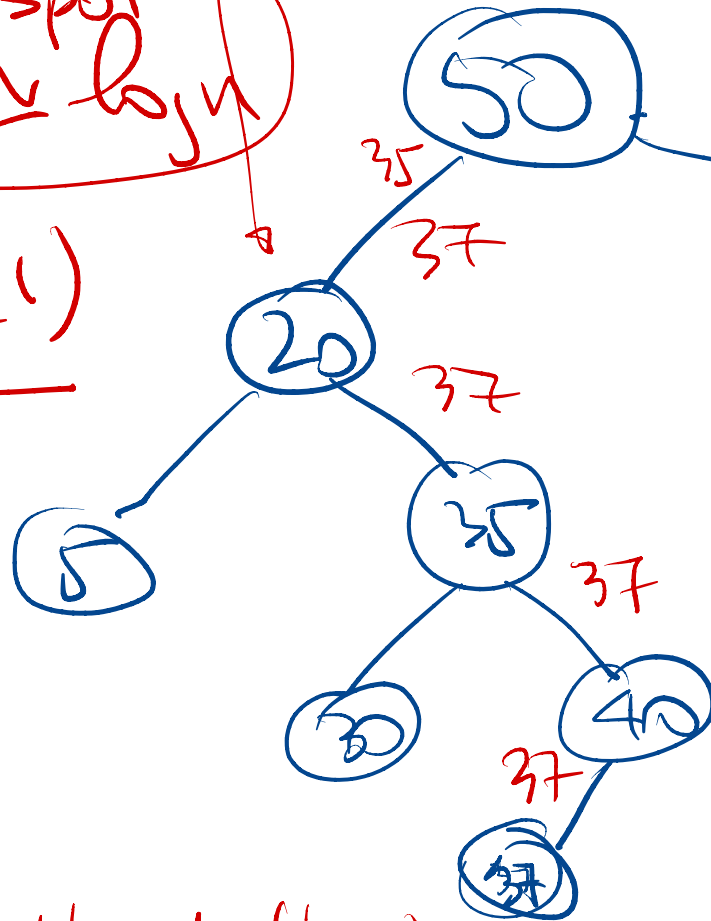
Input 50, 20, 70, 35, 5, 100, 60, 80, 30, 40, 120, 37

Search for spot  
 $\approx$  depth  $\approx \log n$

insert  $\Theta(1)$

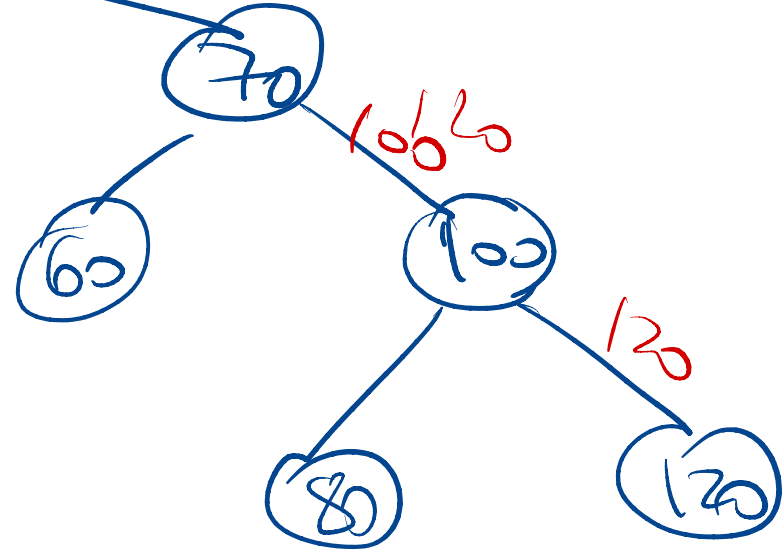
inorder  
 $\downarrow$   
sorted

if depth  $\approx \log n$   
BALANCED



worst branch  
depth =  $\Theta(n)$

UNBALANCED  
 $\Theta(n^2)$  SORT TIME





Merge sort  
procedure/steps

$$T(n) = 2T(n/2) + n$$

- worst case  $\Theta(n \log n)$

$\Downarrow$   
every case  
 $O(n \log n)$

splitting

merge

merge

6, 3, 7, 2, ~~4, 8, 1, 5~~

6, 3 | 7, 2  
 $s_2$

4, 8 | 1, 5  
 $s_3$

6 | 3  
 $s_4$

7 | 2  
 $s_5$

4 | 8

1 | 5  
 $s_7$

3, 6

2, 7

4, 8

1, 5

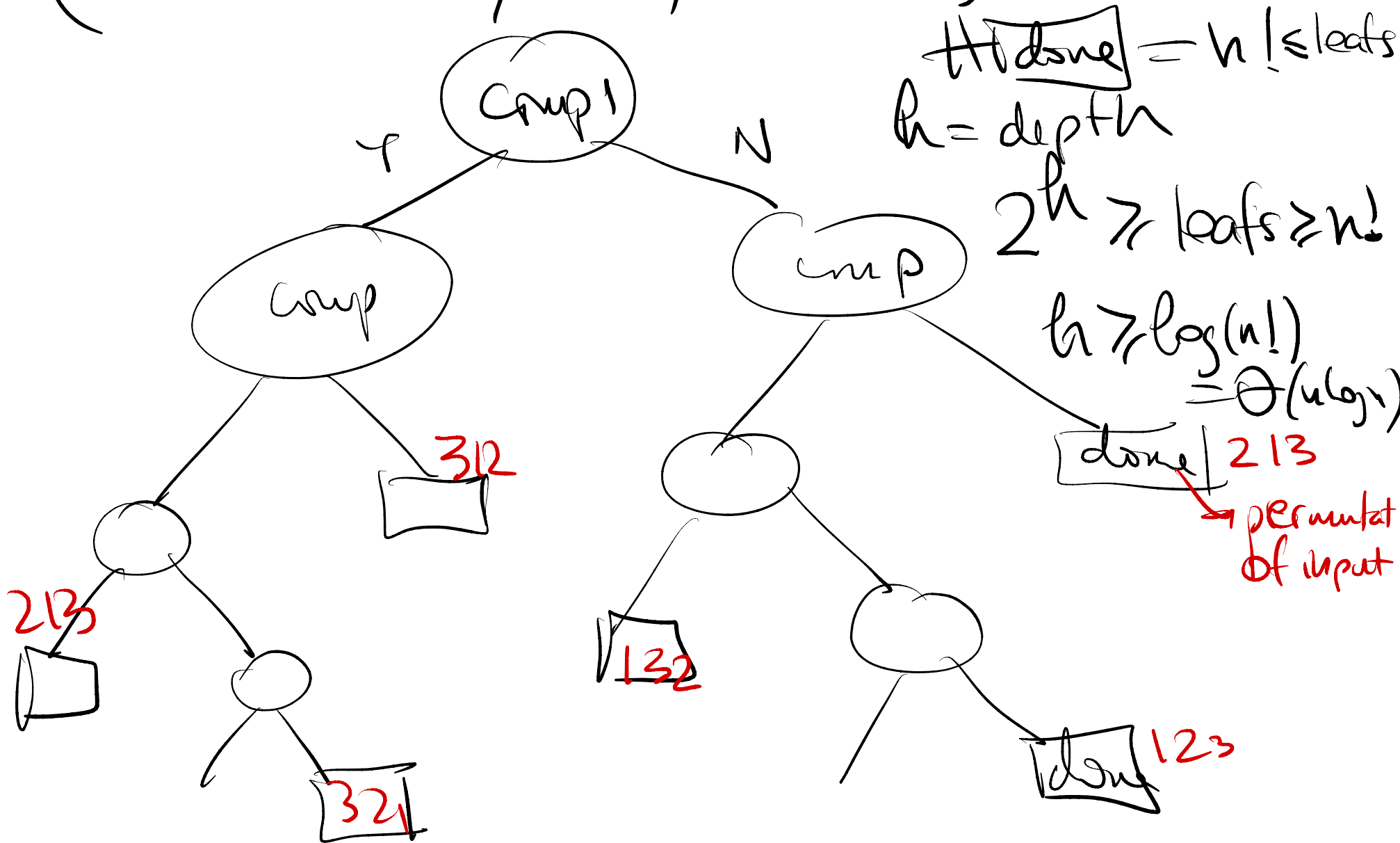
2, 3, 6, 7

1, 4, 5, 8

1, 2, 3, 4, 5, 6, 7, 8

Th) Any comparison-based ALG (A)  $|A|=n$   $n \rightarrow$   
 asymptotically at least  $\Theta(n \log n)$

(ALG sorts any array correctly)

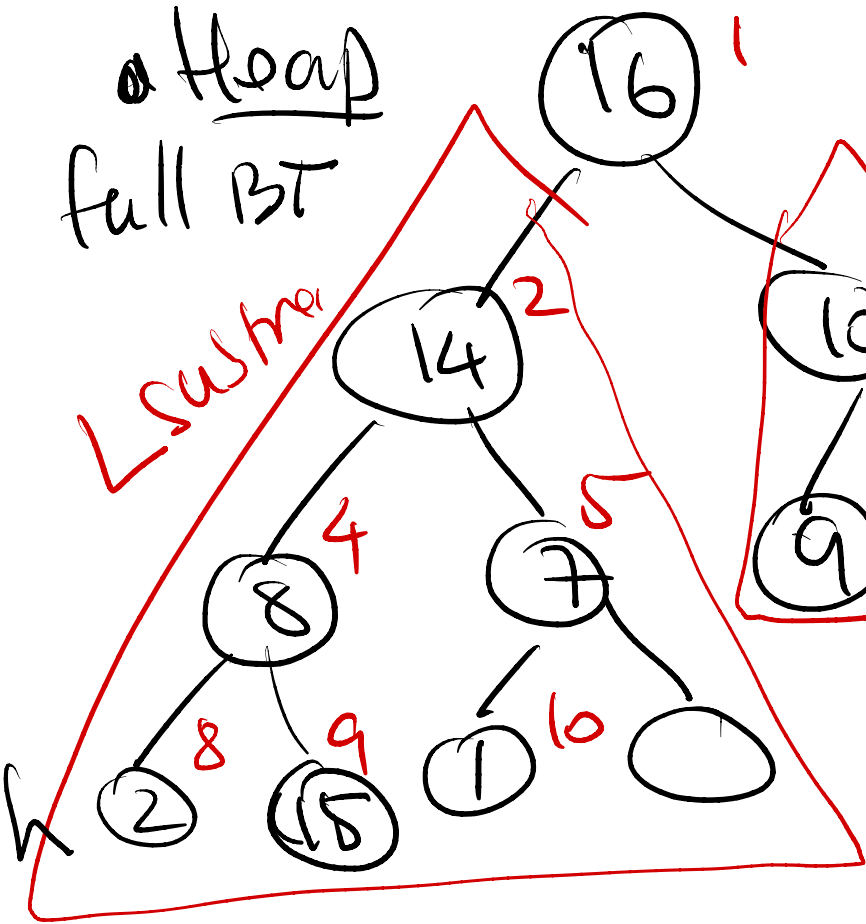


# Heap Sort

input Array

1	2	3	4	5	6	7	8	9	10
16	14	10	8	7	9	3	2	15	1

Heap  
full BST



$R_{child}(\text{index } k) = 2k + 1$   
 $L_{child}(\text{index } k) = 2k$

$Parent(k) = \lfloor \frac{k}{2} \rfloor$

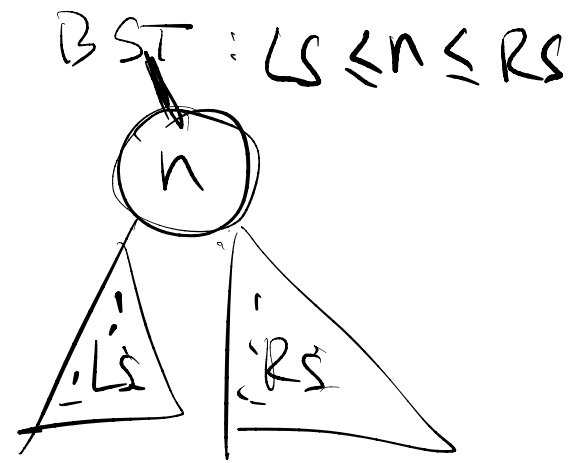
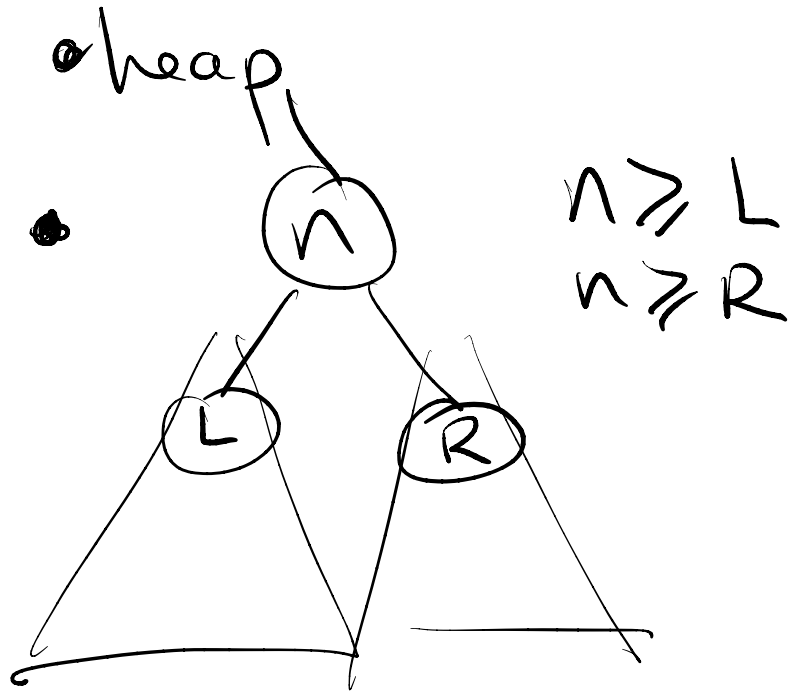
$depth = \log(n)$

$balance = \text{ratio} \frac{|L \text{ subtree}|}{|R \text{ subtree}|}$

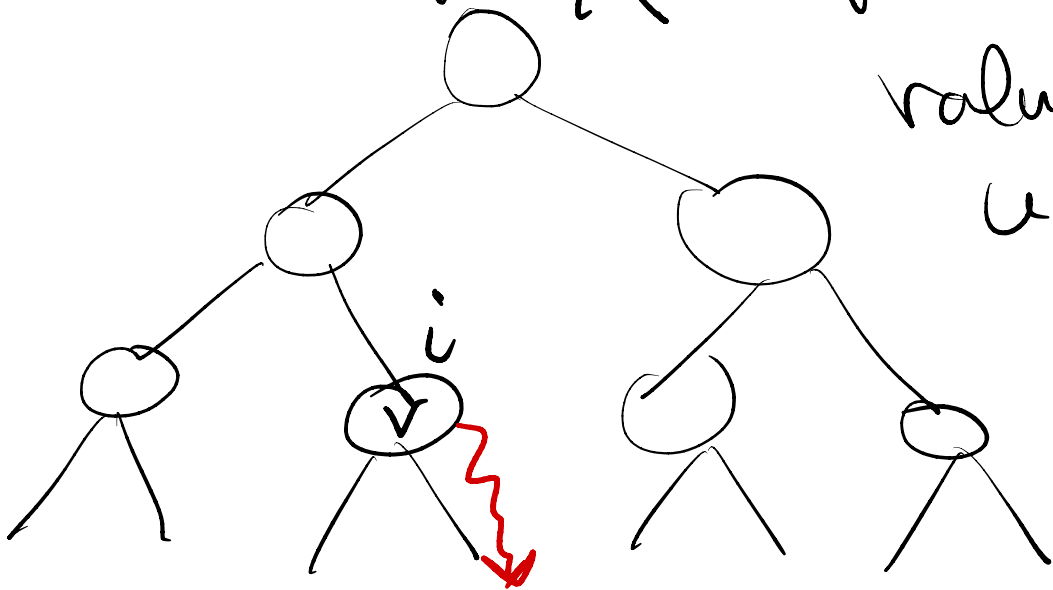
$1 \leq balance \leq \frac{2^h - 1}{2^{h-1} - 1} \approx 2$

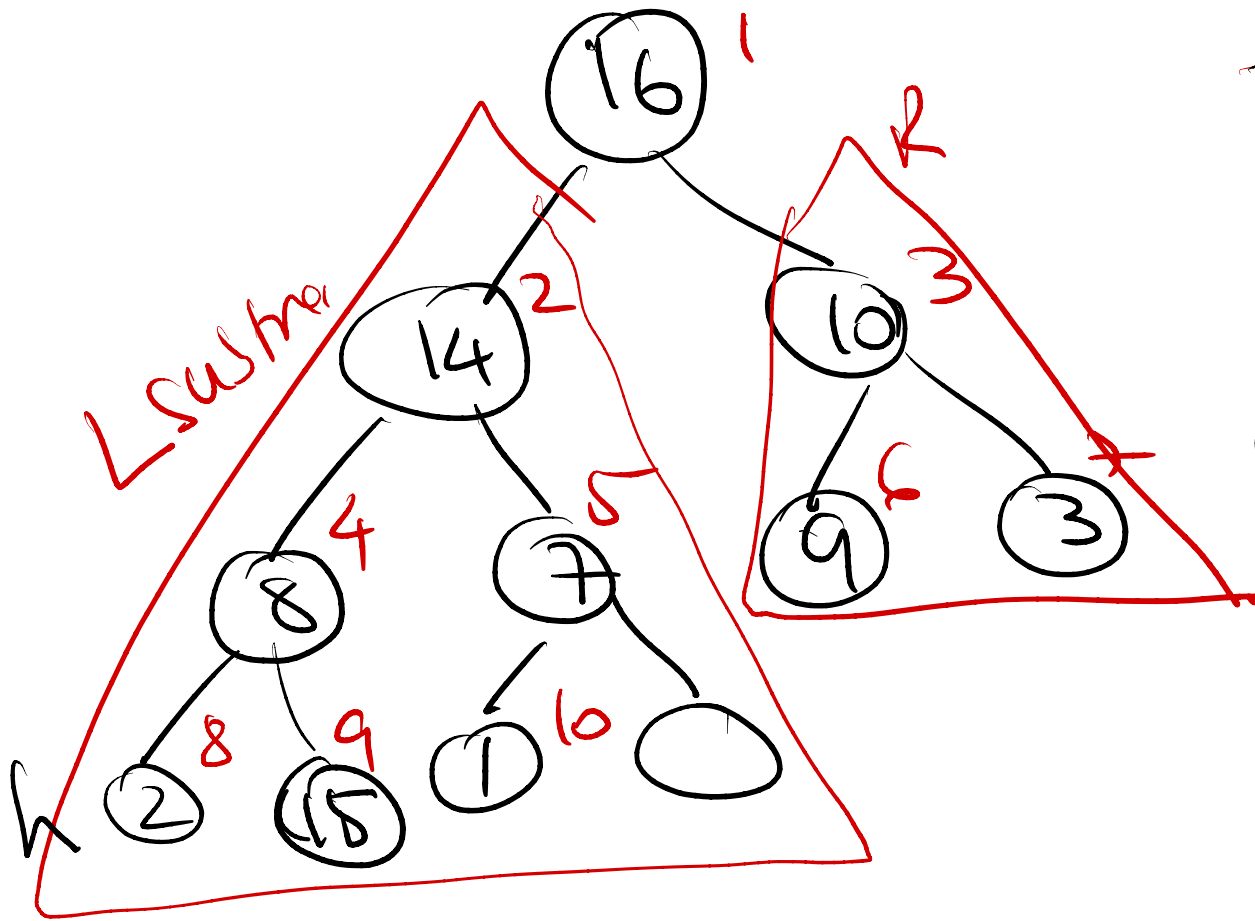
max balance  
layer  $h$  full-RS, empty-RS

# Max-heap

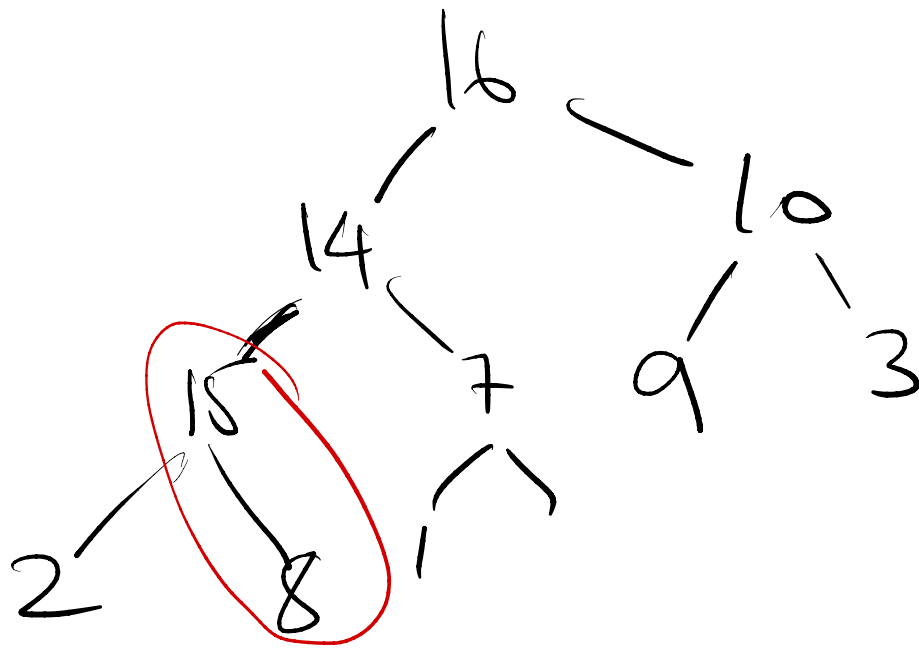


Max-heapify (heap ~~H~~, index  $i$ , val  $v$ ) : float that  
value down in the heap  
until its good

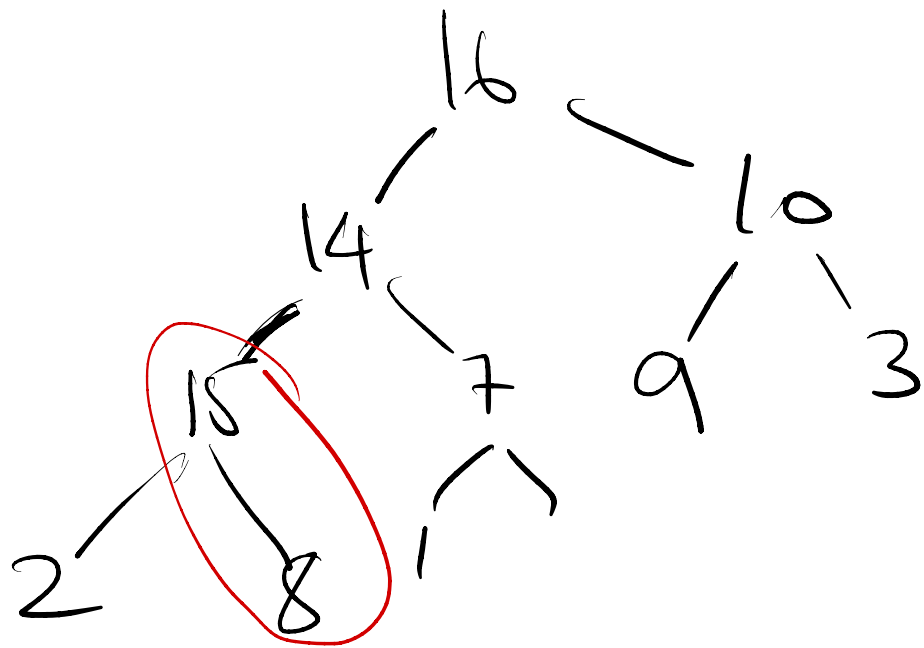




float down 8, 14  
 (val too small)  
 along the branch  
8 float down  
 children(8)  
 if  $8 > (2, 15)$  done  
 else  $8 < 15$  swap  
 repeat until 8 is  
 bigger than both  
 children



-14



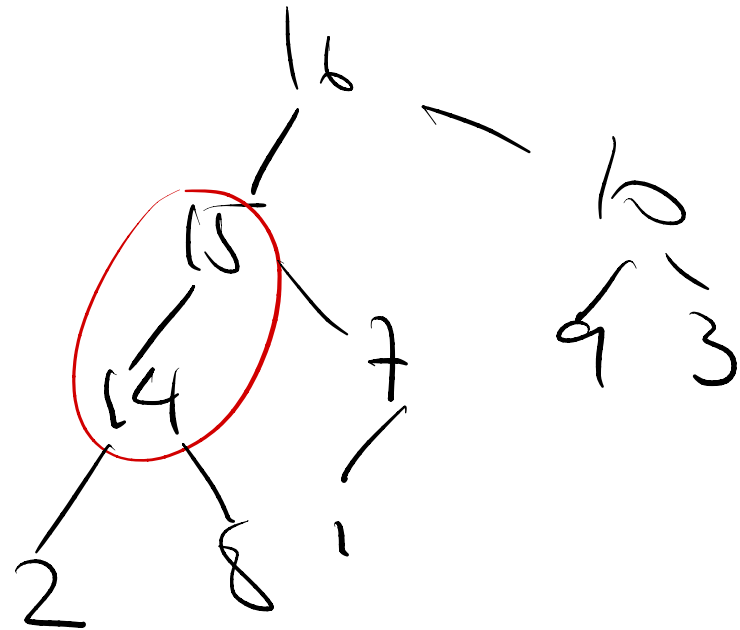
RT MAX-heap

# swaps  $\times \Theta(\text{swap})$

$\Theta(\log n) \times \Theta(1)$

$\Theta(\log n)$

14 - swap down with 15



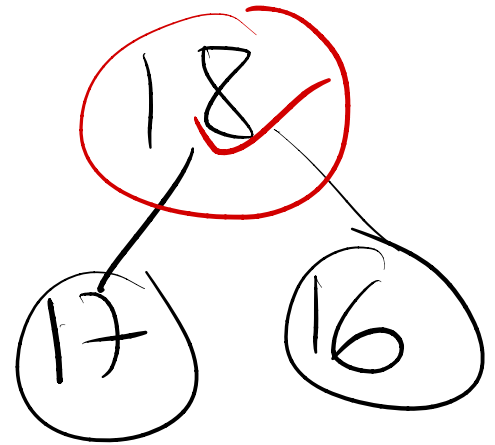
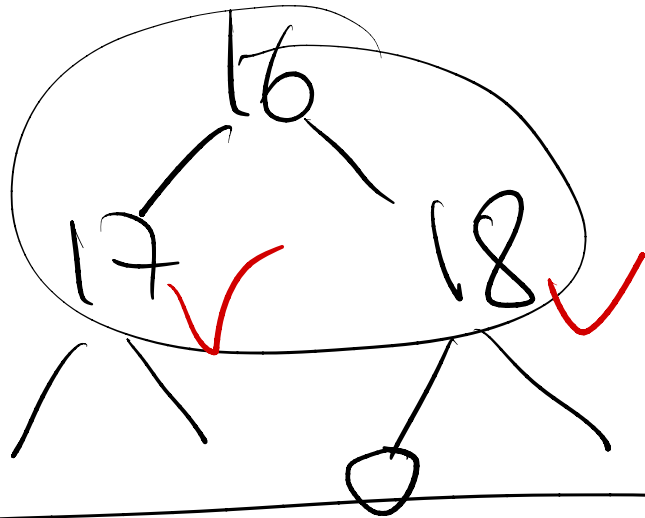
- 14 - vs (2, 8) done

14 is in correct spot

Max heap (H)  $n/2?$  ←

for  $i = \text{index } n$  to 1 (exclude leafs)  $n/2$

Max-heapify (H, i)



HeapSort - Decrease

$\Theta(n \log n)$

- create Heap H
- Max-heapify (H)

• loop all elem  $\Theta(n)$   
 ↳ swap (root) with leaf } extract (root)  $\Theta(1)$   
 ↳ Max-heapify (H, root) }  $\Theta(\log n)$



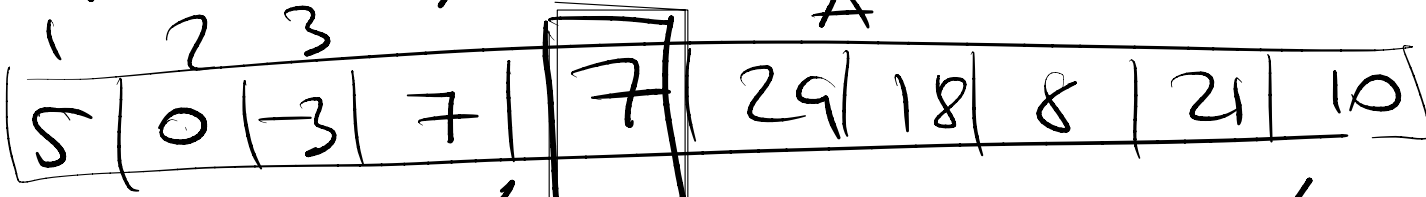
• fix max-heap property  
 MaxHeapify (H, root) : floats down  $\square$   
 to correct spot.



# Quick Sort ( $A[b:e]$ )

$A = [0, 29, 18, 7, 0, 7, \dots]$

A



Smaller than  $A[p]$   $p=5$

bigger than  $A[p]$

①  $p = \text{pivot}$   
 $A[p] = 7$   
**PARTITION**  
(non-rec)

② QS ( $A[b:p]$ ) left side

③ QS ( $A[p+1:e]$ )

$p = \text{half}$

$$T(n) = \Theta(\text{part}) + 2T(n/2)$$

need  $\Theta(\text{part}) = \Theta(n)$

$$p = 1/3$$

$$\Theta(\text{part}) + T(n/3) + T(2/3)$$

$$p$$

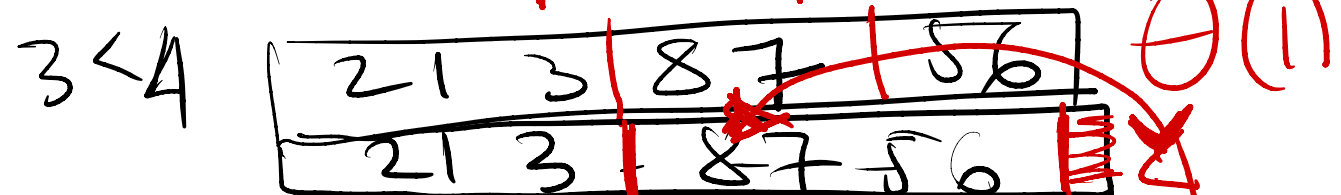
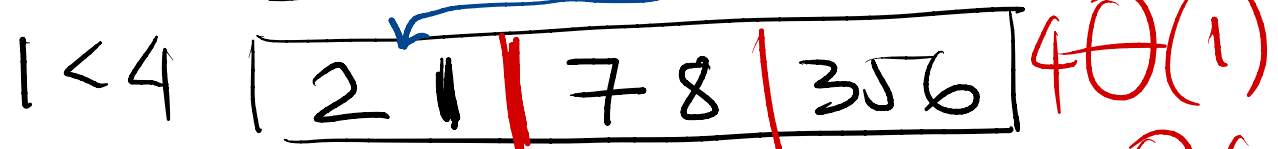
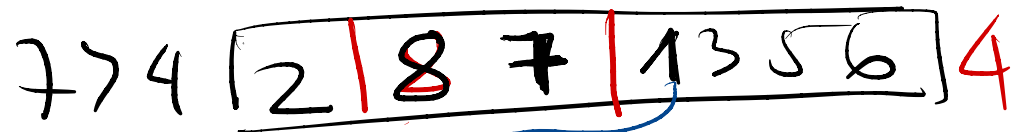
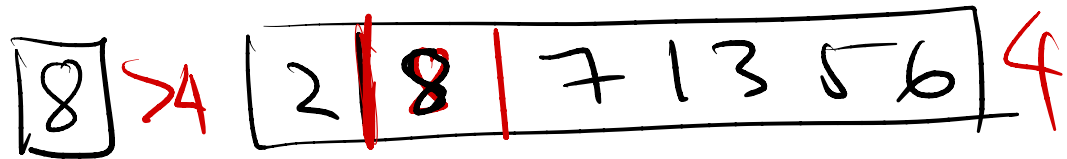
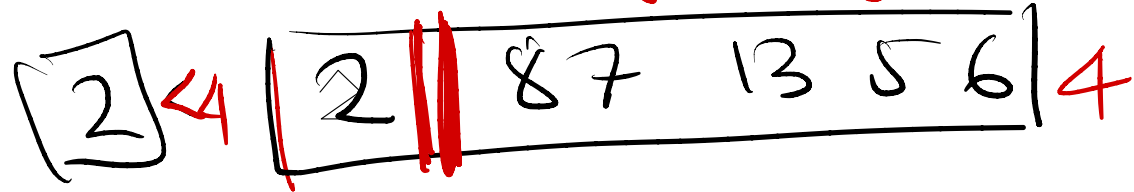
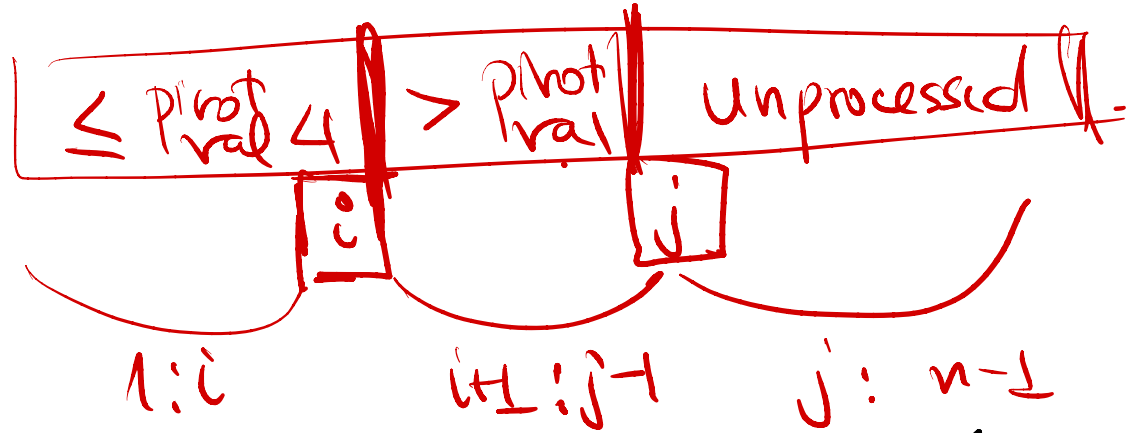
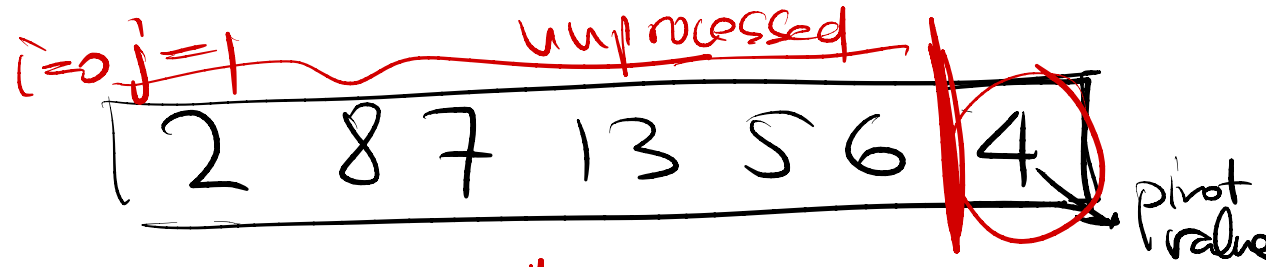
$$\Theta(\text{part})$$

$$T(p) + T(n-p)$$

worst  $p=1$

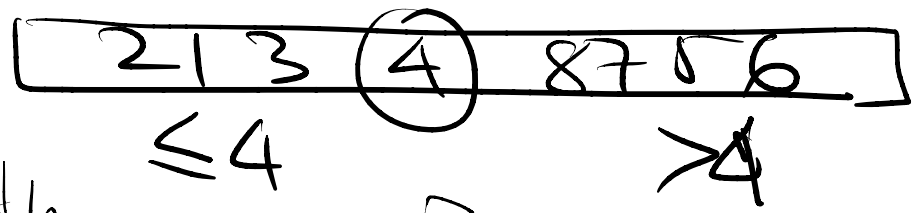
$$T(n) = \Theta(n) + T(1) + T(n-1)$$

# Partition

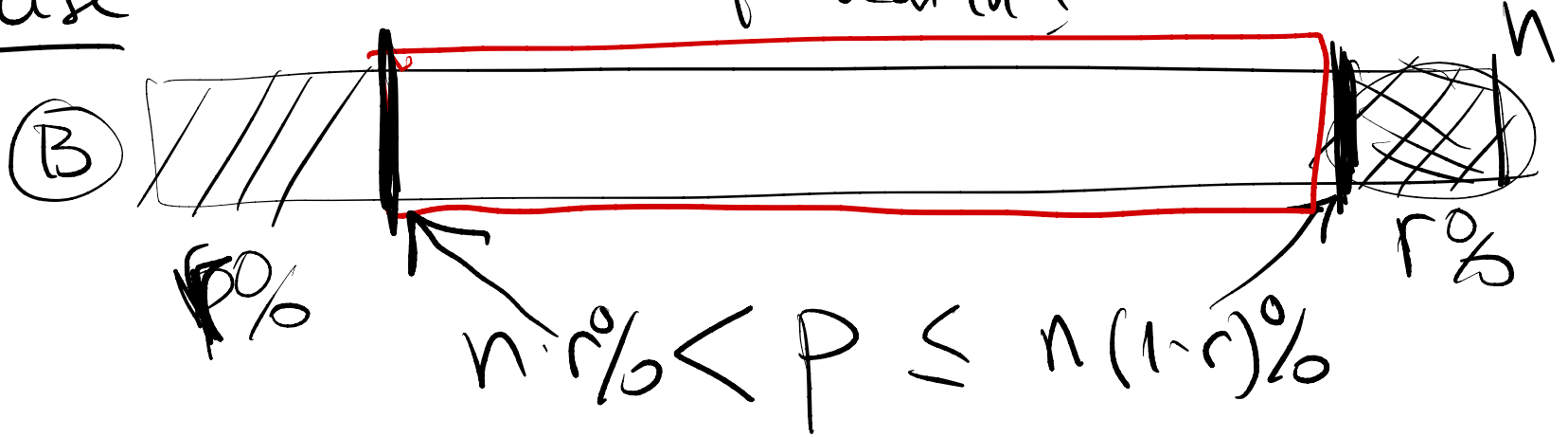


Swap  $i++$   $j++$   $\Theta(n)$

$(1, 8)$  first in big group



Exercise (A) Partition with  $p = \text{median}$ ?



$r \approx 1\%$

$$\frac{n}{100} \leq p \leq \frac{99n}{100}$$

prove that  $T(n) = \Theta(n \log n)$

$$T(n) \approx T(p) + T(n - p) + \Theta(n)$$

(Th)

on average  
??

$$T(n) = \Theta(n \log n)$$

prob( $p = \text{index}$ ) = uniform =  $\frac{1}{n}$  (shuffle the array once)

left side

right side

prob  
 $\frac{1}{n}$

$n-1$	0	$\frac{1}{n}$
$n-2$	1	$\frac{1}{n}$
$n-3$	2	$\frac{1}{n}$
$\vdots$	$\vdots$	$\frac{1}{n}$
1	$n-2$	$\frac{1}{n}$
0	$n-1$	

$$T(n) = n + \frac{1}{n} \sum_{p=0}^{n-1} [T(p) + T(n-p-1)]$$