

"Condition": while we haven't reached end of L and the end of R

Q. Given L and R of size n, how long does Merge(L, R) take (running time)?

~~(A)~~  $\Theta(n)$       (G)  $\Theta(n \log n)$       (B)  $\Theta(n^2)$

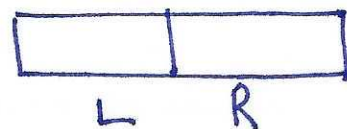
$\Theta(2n)$        $O(n)$        $\Theta(n)$

So, while loop, in each iteration, increment  $i_A$ .  
The index  $i_A$  has max. value  $2n-1$ . Hence, while loop runs at most  $2n$  times. The running time is (exactly)  $\Theta(n)$ .

Given L of size m and R of size n, both sorted arrays, merging can be done in  $\Theta(n+m)$  time.

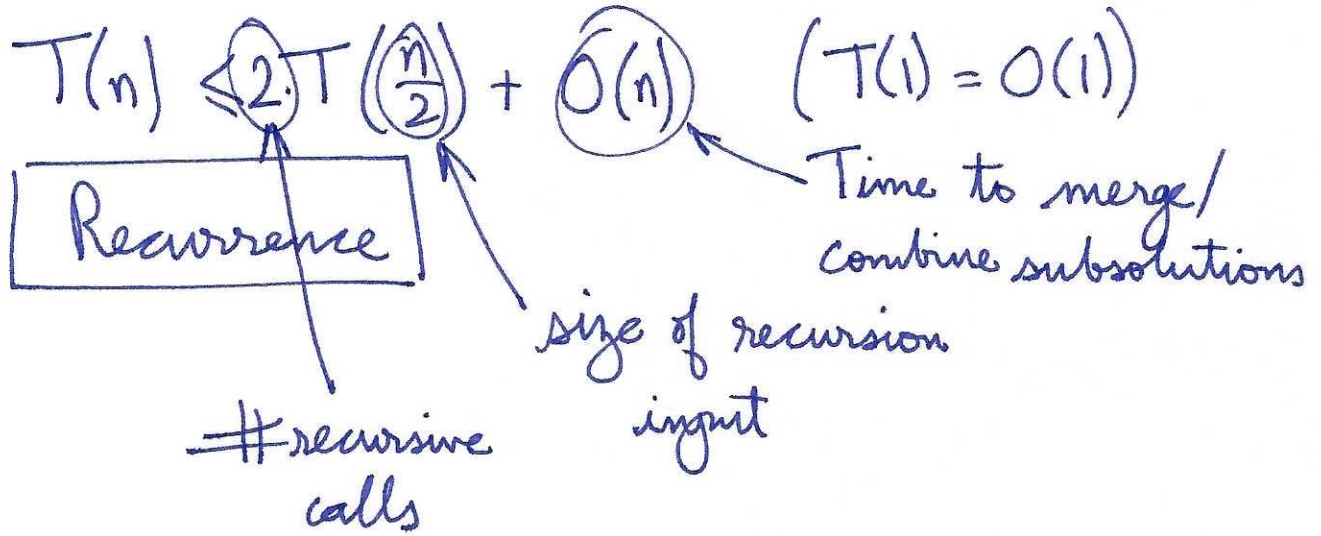
MergeSort(A)

- $O(1)$  1. If size of A  $\leq 1$ , return A. (Base case)
- $O(n)$  2.  $L = A[0..n/2]$ ,  $R = A[n/2+1..n]$  } (Divide) A
- $T(n/2)$  3.  $L = \text{MergeSort}(L)$
- $T(n/2)$  4.  $R = \text{MergeSort}(R)$
- $O(n)$  5. Output Merge(L, R) (Conquer)



$T(n)$  = worst case running time of MergeSort on an array of size  $n$

$$T(n) \leq O(1) + O(n) + T(n/2) + T(n/2) + O(n)$$



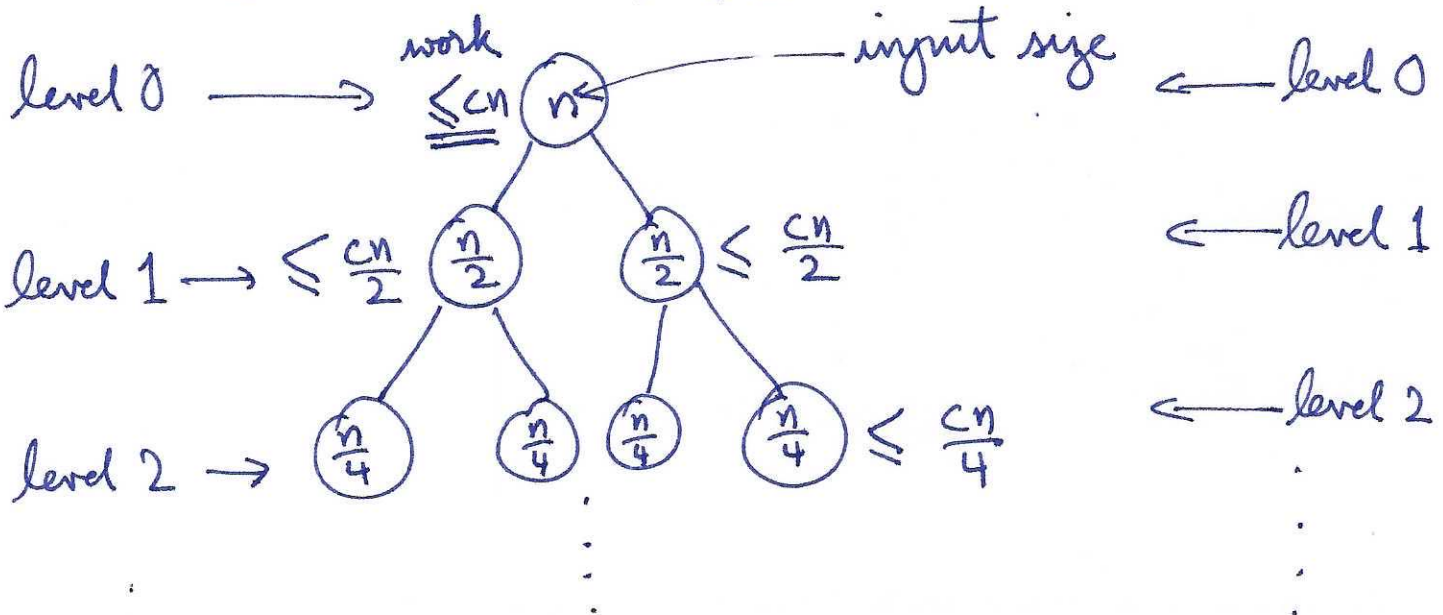
Solve this recurrence

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

Base case  $T(1) \leq c$

Constant

Work in a call is running time OTHER than recursive calls





Q. What is input size at level  $i$ ?

(R)  $n/2(i+1)$  ~~(G)~~  $n/2^i$  (B)  $2^i$

Q. How many calls at level  $i$ ?

(R)  $2(i+1)$  (G)  $n/2^i$  ~~(B)~~  $2^i$

Work done in a call at level  $i \leq \frac{C \cdot n}{2^i}$

Q. What is the total work done in ALL calls at level  $i$ ?

~~(R)~~  $\leq cn$  (G)  $\leq cn \lg n$  (B)  $\leq cn \times 2^i$

Total work in ALL calls at level  $i$

$\leq$  (# calls at level  $i$ )  $\times$  (max work in any call at level  $i$ )

$\leq 2^i \times \frac{cn}{2^i} = cn$  # levels  $\leq \lceil \lg_2 n \rceil$

Total work overall = Total running time

$= \sum_{i=0}^{\lg_2 n} (\text{Total work in all calls at level } i)$

$\leq \sum_{i=0}^{\lceil \lg_2 n \rceil} cn \leq cn \lceil \lg_2 n \rceil = O(n \lg n)$

## Punchlines:

→ sorted arrays

(1) Merge runs in linear time.

(2) Mergesort runs in  $\Theta(n \log n)$ .  
 $O(n \log n)$

(3) ANY algorithm with the recurrence

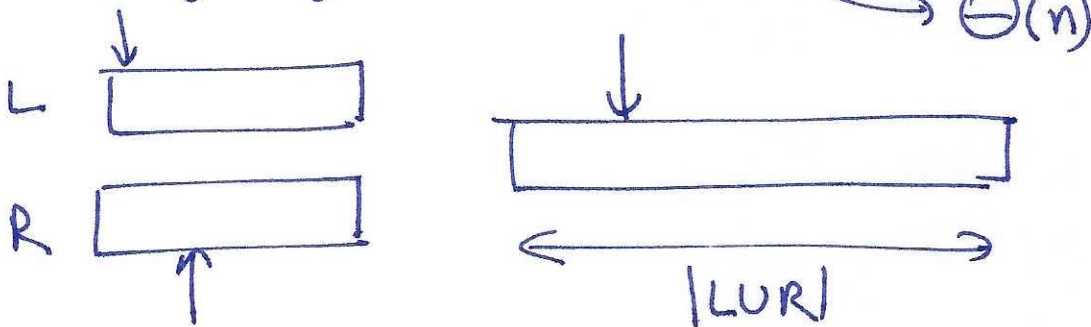
$$T(n) \leq 2T\left(\frac{n}{2}\right) + cn \quad T(1) \leq c$$

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

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## Quicksort

Merging requires extra memory.



NOT "in-place"

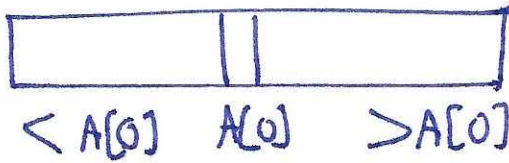
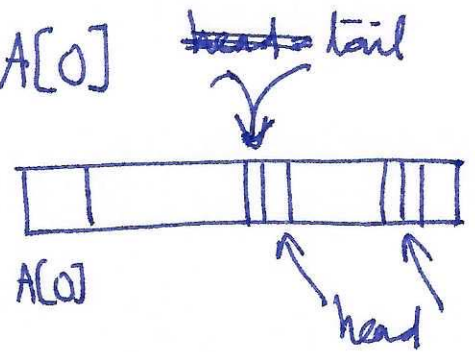
In-place sorting: requires  $O(\log n)$  extra memory  
Heapsort

Quicksort(A) ( $n = \text{length of } A$ )

1) If  $n=1$ , do nothing and return.

2) Partition  $A[1..n-1]$  using pivot =  $A[0]$

3) Swap  $A[0]$  with  $A[\text{tail}]$   
(and you will get)



4) Quicksort( $A[0..tail-1]$ )

5) Quicksort( ~~$A[0..head]$~~  ( $A[\text{head}..n-1]$ ))

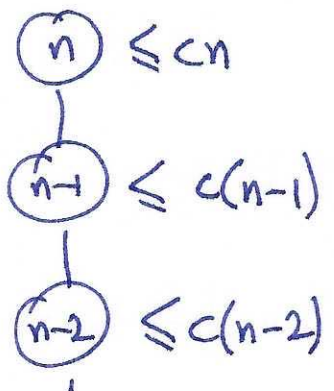
sum of sizes  $\leq n-1$

What is the worst-case recurrence for Quicksort?

~~(R)~~  $T(n) \leq 2T(n/2) + O(n)$   $\text{tail} > \frac{n}{2}$

(G)  $T(n) \leq 2T(n-1) + O(n)$

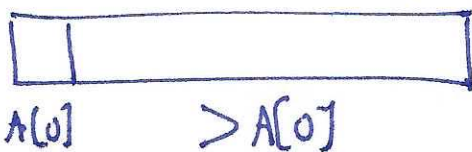
$\checkmark$  (B)  $T(n) \leq T(n-1) + O(n)$   
 $\geq$



In worst-case, Quicksort

takes  $\Omega(n^2)$  time.

When A is sorted!

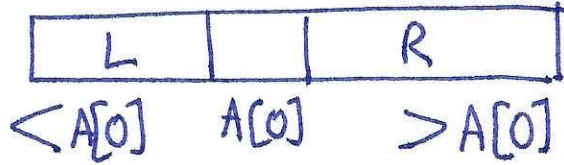


Total work  $\leq c \sum_{i=0}^{n-1} i$   
 $= O(n^2)$





- 1) Pick a "pivot" ( $A[0]$ )
- 2) Partition A by pivot

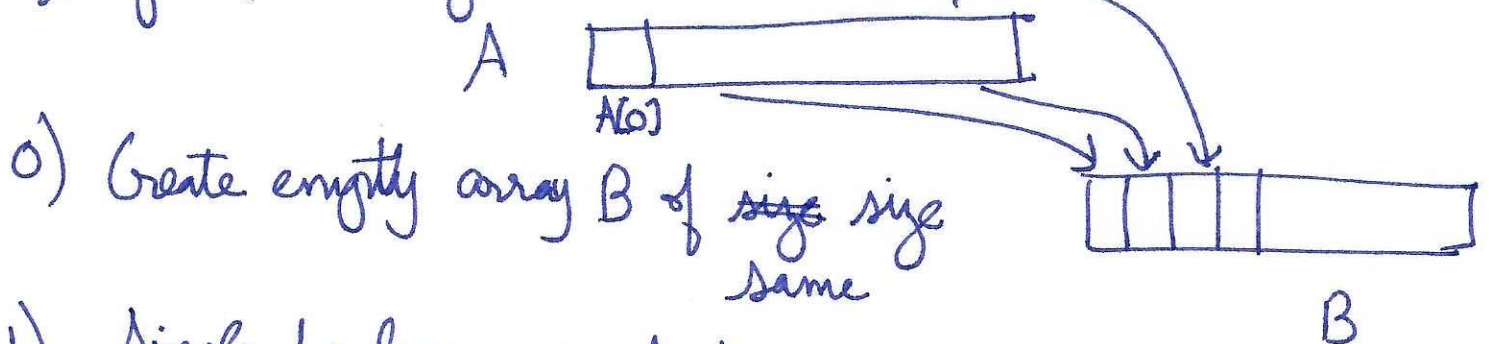


(Assume elements are distinct)

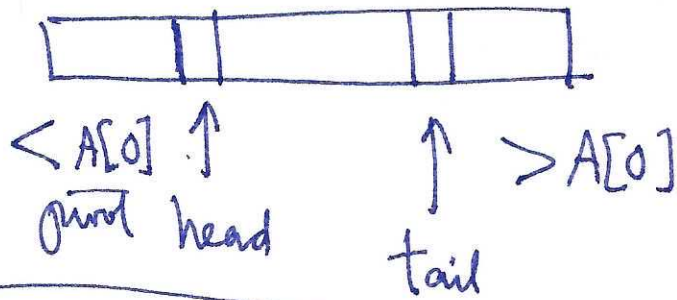
- 3) Recursively sort  $<A[0]$  part and  $>A[0]$  part
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### How to partition

Simple (not in-place solution)



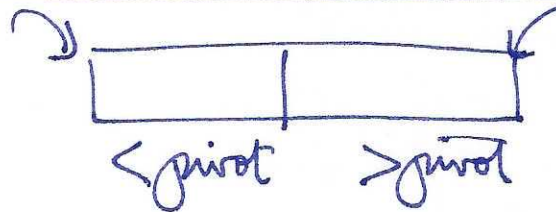
- 0) Create empty array B of ~~size~~ size same
- 1) Single for loop over A to copy every element  $<A[0]$  into B
- 2) Insert  $A[0]$  into B (at the end of copied elements)
- 3) Another for loop over A to copy every element  $>A[0]$  into B.



If  $A[\text{head}] < A[0]$ ,  $\text{head}++$   
 If  $A[\text{tail}] > A[0]$ ,  $\text{tail}--$

When both stop,  $A[\text{head}] > A[0]$  and  $A[\text{tail}] < A[0]$ .  
 Swap  $A[\text{head}]$  and  $A[\text{tail}]$ , and continue.

Partition( $A$ , pivot)



(Assuming values are distinct)

1.  $\text{head} = 0$ ,  $\text{tail} = A.\text{length} - 1$

2. while ( $\text{head} < \text{tail}$ )

(a) while ( $A[\text{head}] < \text{pivot}$ ),  $\text{head}++$

(b) while ( $A[\text{tail}] > \text{pivot}$ ),  $\text{tail}--$

(c) swap  $A[\text{head}]$  with  $A[\text{tail}]$

Partition runs in  $\Theta(n)$  time.

## Randomized Quicksort

Pick pivot at random.

Pick <sup>uniform</sup> random  $i$  and swap  $A[0]$  with  $A[i]$ .

Run Quicksort

$O(n \log n)$  averaged over randomness

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All sorting algorithms discussed run in  $\Theta(n \log n)$ .

We cannot beat this bound!

(unless additional assumptions on the input are made)

No sorting algorithm that only uses comparisons can run in time better than  $n \log n$ .