



Design and Analysis  
of Algorithms I

# Introduction

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## Merge Sort (Overview)

# Why Study Merge Sort?

- Good introduction to divide & conquer
  - Improves over Selection, Insertion, Bubble sorts
- Calibrate your preparation
- Motivates guiding principles for algorithm analysis (worst-case and asymptotic analysis)
- Analysis generalizes to “Master Method”

# The Sorting Problem

Input : array of n numbers, unsorted.

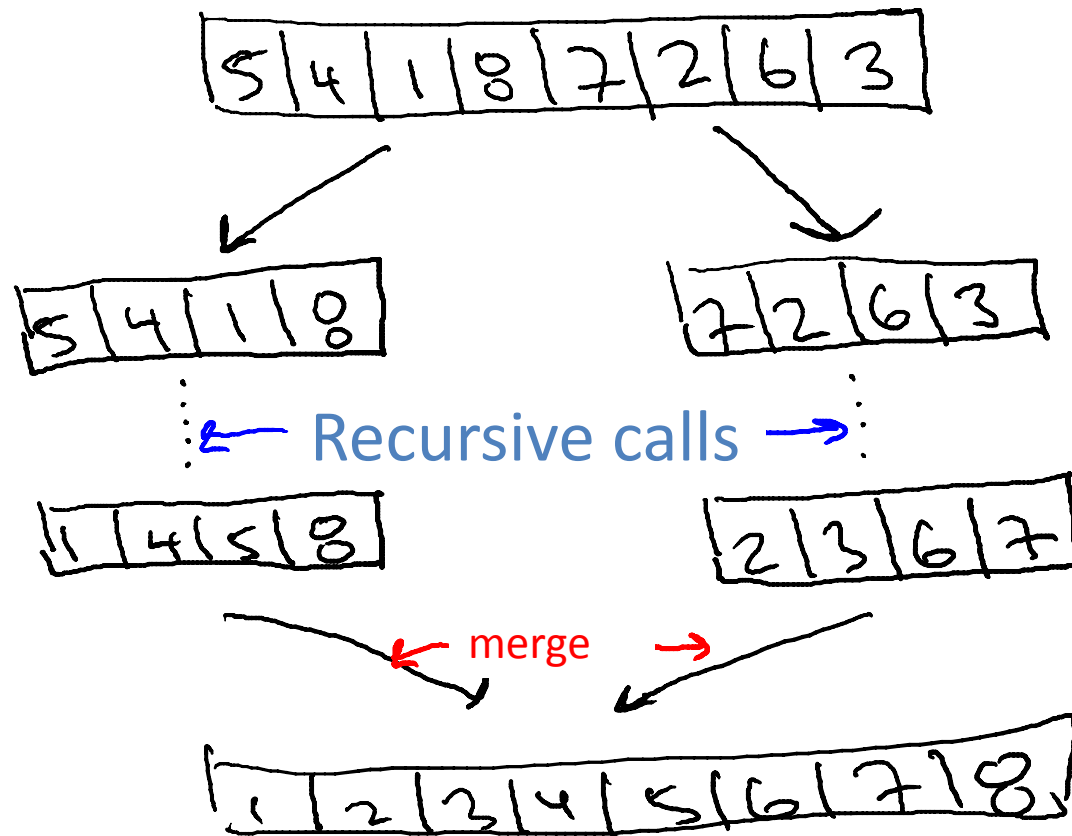
5 4 1 8 7 2 6 3

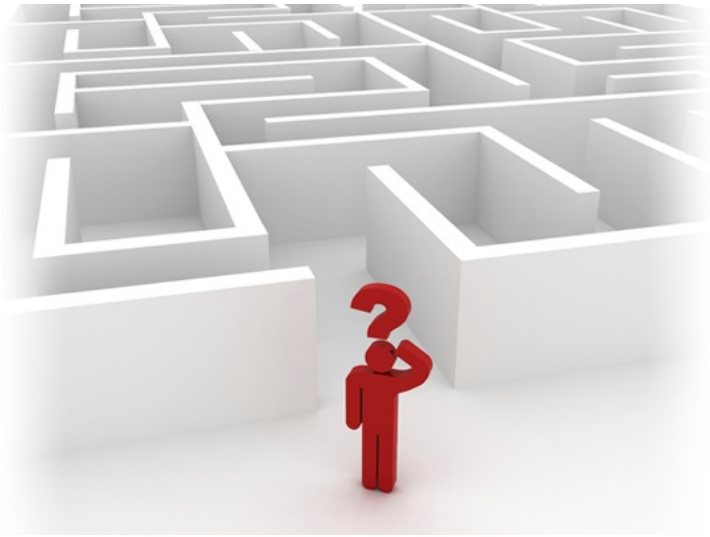
Assume  
Distinct

Output : Same numbers, sorted in increasing order

1 2 3 4 5 6 7 8

# Merge Sort: Example





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## Merge Sort (Pseudocode)

# Merge Sort: Pseudocode

- recursively sort 1<sup>st</sup> half of the input array
  - recursively sort 2<sup>nd</sup> half of the input array
  - merge two sorted sublists into one
- [ignores base cases]

## Pseudocode for Merge:

C = output [length = n]

A = 1<sup>st</sup> sorted array [n/2]

B = 2<sup>nd</sup> sorted array [n/2]

i = 1

j = 1

for k = 1 to n

    if A(i) < B(j)

        C(k) = A(i)

        i++

    else [B(j) < A(i)]

        C(k) = B(j)

        j++

end

(ignores end cases)

# Merge Sort Running Time?

Key Question : running time of Merge Sort on array of  $n$  numbers ?

[running time  $\sim$  # of lines of code executed]



## Pseudocode for Merge:

C = output [length = n]

A = 1<sup>st</sup> sorted array [n/2]

B = 2<sup>nd</sup> sorted array [n/2]

i = 1

j = 1

} 2 operations

for k = 1 to n ✓

if A(i) < B(j) ✓

C(k) = A(i) —

i++ —

else [B(j) < A(i)]

C(k) = B(j) —

j++ —

end

(ignores end cases)

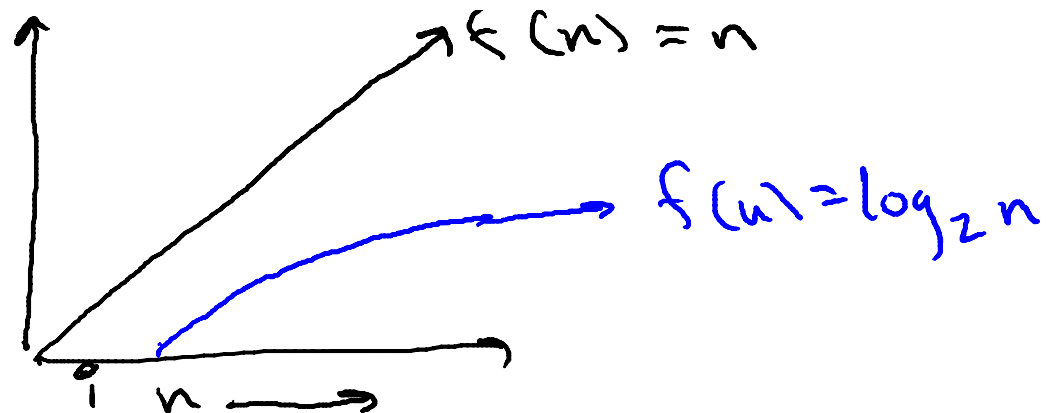
# Running Time of Merge

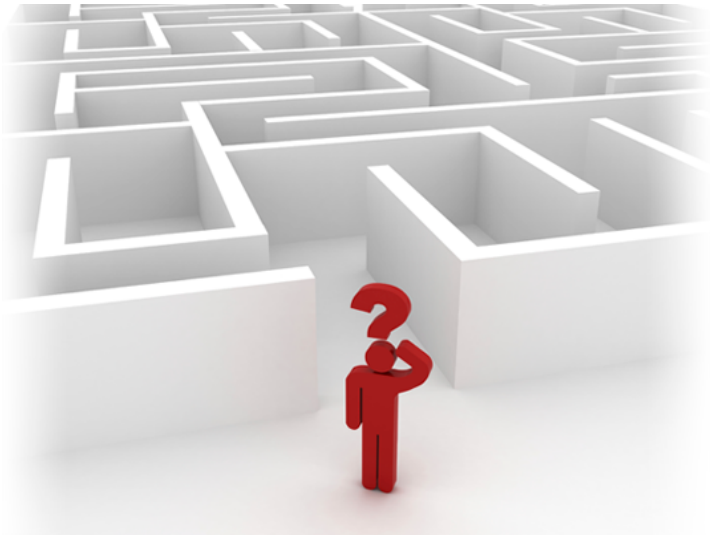
Upshot : running time of Merge on array of  $m$  numbers is  $\leq 4m + 2$   
 $\leq 6m$  (Since  $m \geq 1$ )

# Running Time of Merge Sort

Claim : Merge Sort requires  
 $\leq 6n \log_2 n + 6n$  operations  
to sort  $n$  numbers.

Recall :  $\log_2 n$  is the #  
of times you divide by 2  
until you get down to 1





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## Merge Sort (Analysis)

# Running Time of Merge Sort

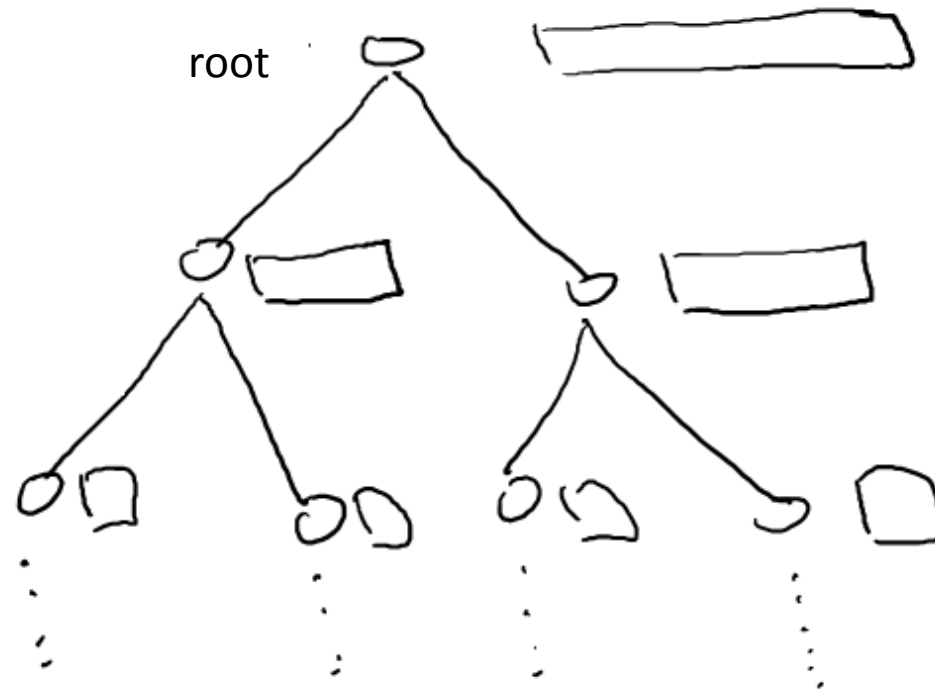
**Claim:** For every input array of  $n$  numbers, Merge Sort produces a sorted output array and uses at most  $6n \log_2 n + 6n$  operations.

### Proof of claim (assuming $n$ = power of 2):

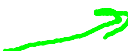
Level 0  
[outer call to  
Merge Sort]

Level 1  
(1<sup>st</sup> recursive  
calls)

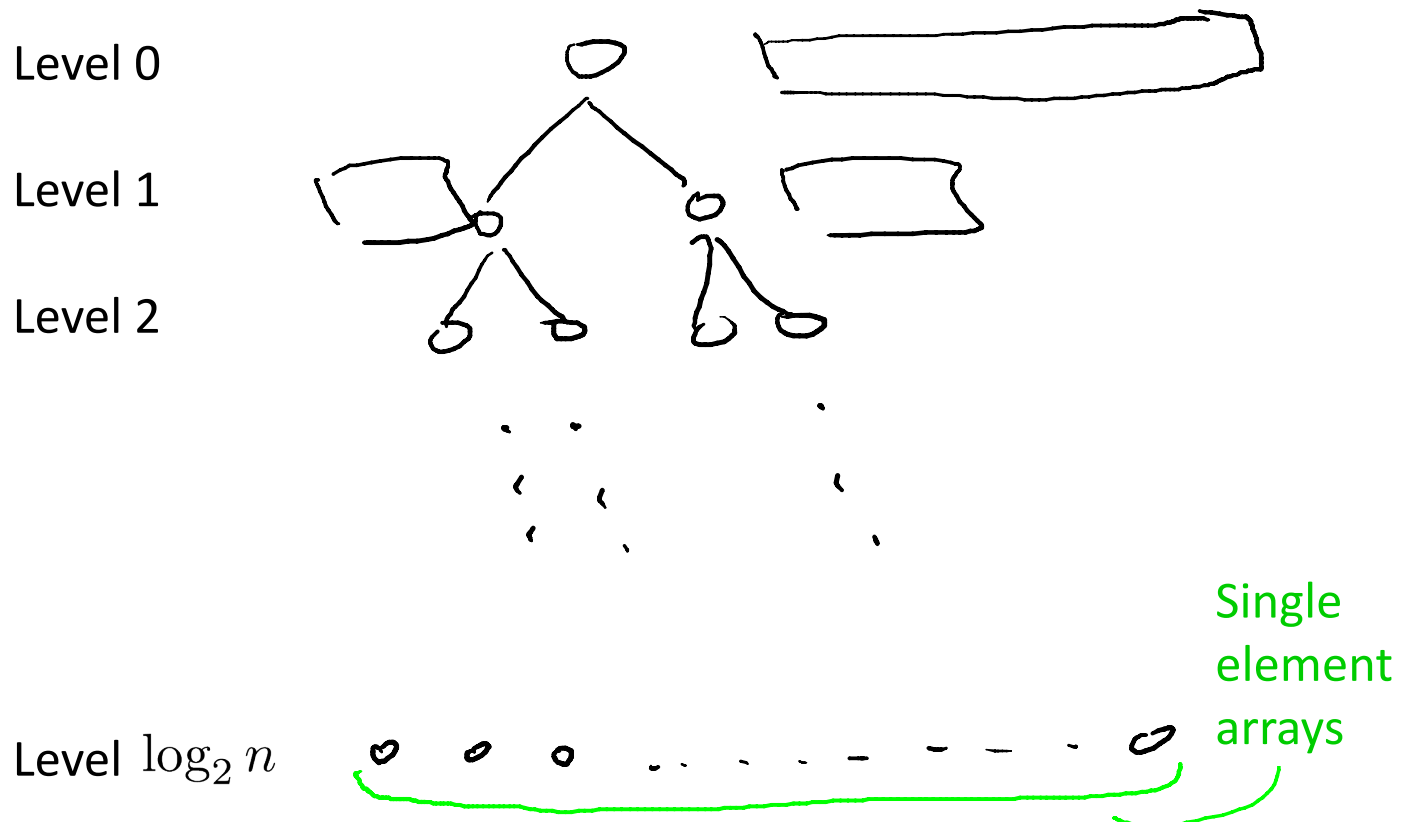
## Level 2



Roughly how many levels does this recursion tree have (as a function of  $n$ , the length of the input array)?

- ☐ A constant number (independent of  $n$ ).
-  ☒  $\log_2 n$        $(\log_2 n + 1)$  to be exact!
- ☐  $\sqrt{n}$
- ☐  $n$

## Proof of claim (assuming $n = \text{power of } 2$ ):






What is the pattern ? Fill in the blanks in the following statement: at each level  $j = 0, 1, 2, \dots, \log_2 n$ , there are <blank> subproblems, each of size <blank>.

☐  $2^j$  and  $2^j$ , respectively

☐  $n/2^j$  and  $n/2^j$ , respectively

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## Proof of claim (assuming $n = \text{power of } 2$ ) :

At each level  $j=0,1,2,\dots, \log_2 n$ ,

Total # of operations at level  $j = 0,1,2,\dots, \log_2 n$

$$\leq 2^j * 6\left(\frac{n}{2^j}\right) = 6n$$

# of level- $j$   
subproblems

Size of level- $j$   
subproblem

Work per level –  $j$   
subproblem

Total

$$6n(\log_2 n + 1)$$

Work  
per level

# of  
levels

# Running Time of Merge Sort

**Claim:** For every input array of  $n$  numbers, Merge Sort produces a sorted output array and uses at most  $6n \log_2 n + 6n$  operations.

QED!