

# Algorithms and Data Structures for Data Science

## Sorting

CS 277

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UNIVERSITY OF  
**ILLINOIS**  
URBANA - CHAMPAIGN

Department of Computer Science

# Exam Information

## **Exam 3 (4/23 — 4/25)**

Covering all material up to last Wednesday (April 10th)

## **Final Exam (05/02 — 05/06)**

Expected time: 1 hour exam in 1 hour, 50 minute time block

50 minute makeup exams *during* final exam time!

# Submit topics or concepts you want reviewed

Google form linked through Prairielearn

# We've seen most core data structures

Lists

Graphs

Trees

Hash Tables

But we haven't seen a great deal of **algorithms!**

For the rest of the class, review core concepts...

And apply them to new problems!

# Learning Objectives

Review fundamentals of lists and Big O

Introduce common sorting algorithms

Practice analyzing the Big O of different methods

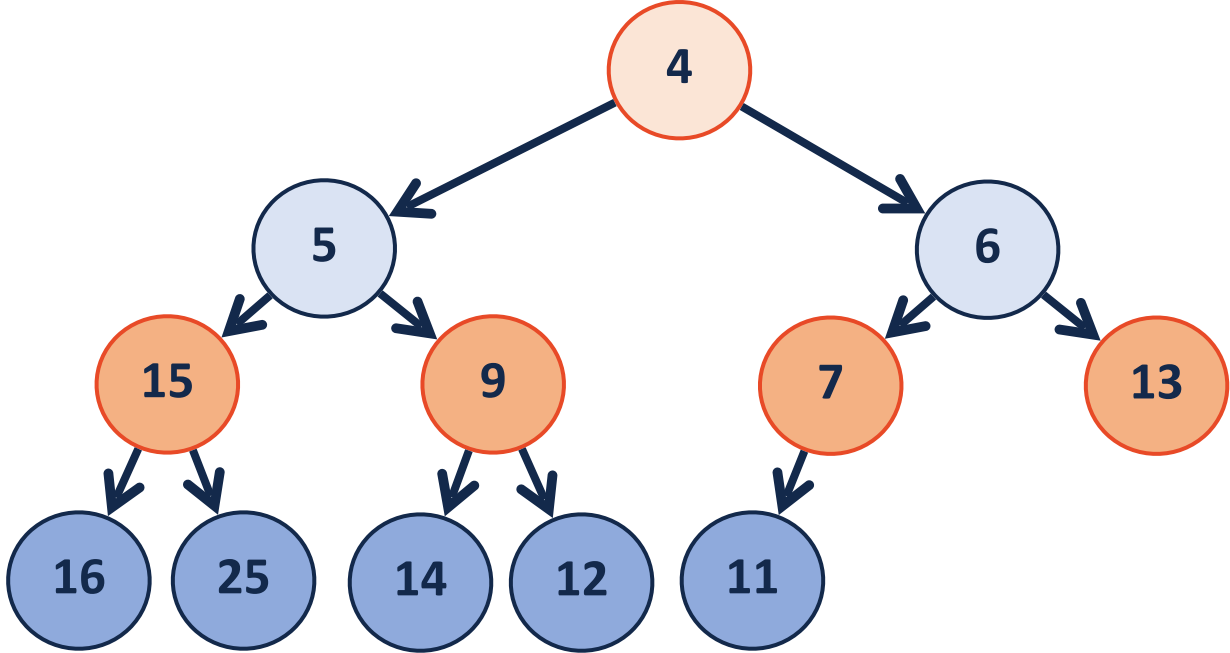
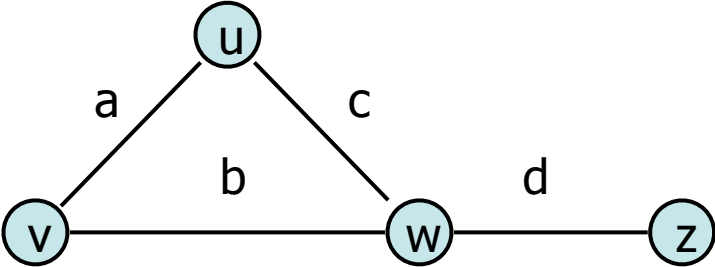


# List Implementations

**Array List**

**Linked List**

# Lists are a great way to store **data structures**

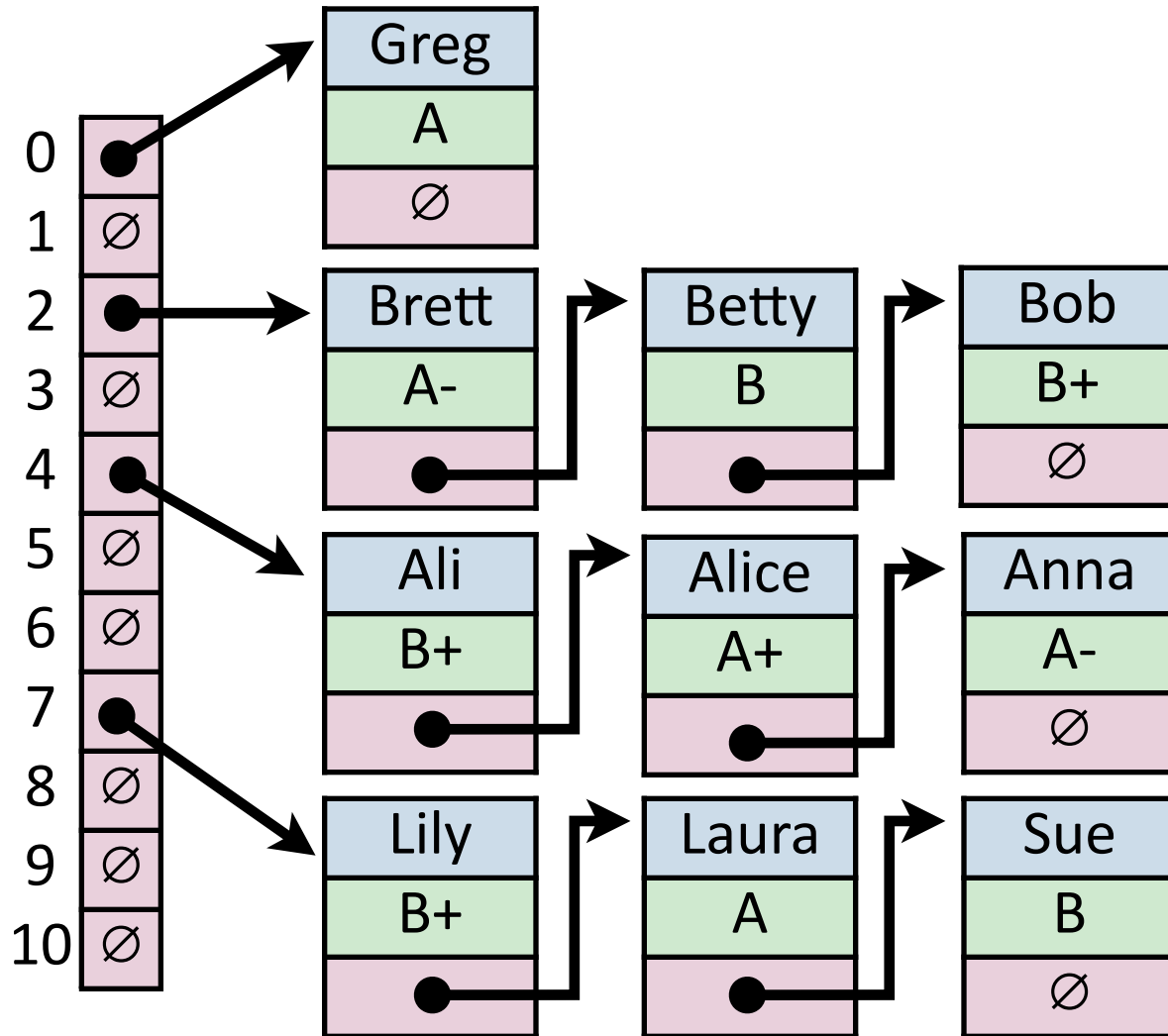


|   |   |   |   |
|---|---|---|---|
| u | u | v | a |
| v | v | w | b |
| w | u | w | c |
| z | w | z | d |

|   |   |   |   |    |   |   |    |    |    |    |    |    |    |    |    |
|---|---|---|---|----|---|---|----|----|----|----|----|----|----|----|----|
|   | 4 | 5 | 6 | 15 | 9 | 7 | 20 | 16 | 25 | 14 | 12 | 11 |    |    |    |
| 0 | 1 | 2 | 3 | 4  | 5 | 6 | 7  | 8  | 9  | 10 | 11 | 12 | 13 | 14 | 15 |

# Lists are a great way to store **data structures**

$$H = \{h_1, h_2, \dots, h_k\}$$



|   |
|---|
| 0 |
| 0 |
| 1 |
| 0 |
| 0 |
| 1 |
| 0 |
| 1 |
| 0 |
| 0 |



# Array Implementation



|  | Array | Singly Linked List |
|--|-------|--------------------|
| Look up given an input <b>position</b>     |       |                    |
| Search given an input <b>value</b>         |       |                    |
| Insert/Remove at <b>front</b>              |       |                    |
| Insert/Remove at <b>arbitrary</b> location |       |                    |

# The Sorting Problem

Given a collection of objects,  $C$ , with comparable values, order the objects such that  $\forall x \in C, x_i \leq x_{i+1}$

**Input:**

|   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|
| 8 | 4 | 3 | 1 | 2 | 5 | 6 | 9 | 0 | 7 |
|---|---|---|---|---|---|---|---|---|---|

**Output:**

|   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|
| 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 |
|---|---|---|---|---|---|---|---|---|---|

# SelectionSort

|   |   |   |   |   |
|---|---|---|---|---|
| 4 | 3 | 6 | 7 | 1 |
|---|---|---|---|---|

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1. Find the  $i$ -th smallest value
2. Place it at position  $i$  via swap
3. Repeat for  $0 \leq i \leq n - 1$

# SelectionSort Efficiency

(large  $n$ )

# InsertionSort

|   |   |   |   |   |
|---|---|---|---|---|
| 4 | 3 | 6 | 7 | 1 |
|---|---|---|---|---|

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1. Assume first value is 'sorted'
2. Loop through remaining values:
3. Insert value into the 'sorted' array

Key trick: Insert by swapping!

# InsertionSort Efficiency

(large  $n$ )



# Best and Worst Case insertionSort

Given the numbers 0 — 6, what is the **best** possible insertionSort input?

|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|
|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|

Given the numbers 0 — 6, what is the **worst** possible insertionSort input?

|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|
|  |  |  |  |  |  |  |
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# Recursive Array Sorting

|   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|
| 0 | 3 | 7 | 5 | 8 | 9 | 2 | 1 | 4 | 6 |
|---|---|---|---|---|---|---|---|---|---|

**Base Case:**

**Recursive Step:**

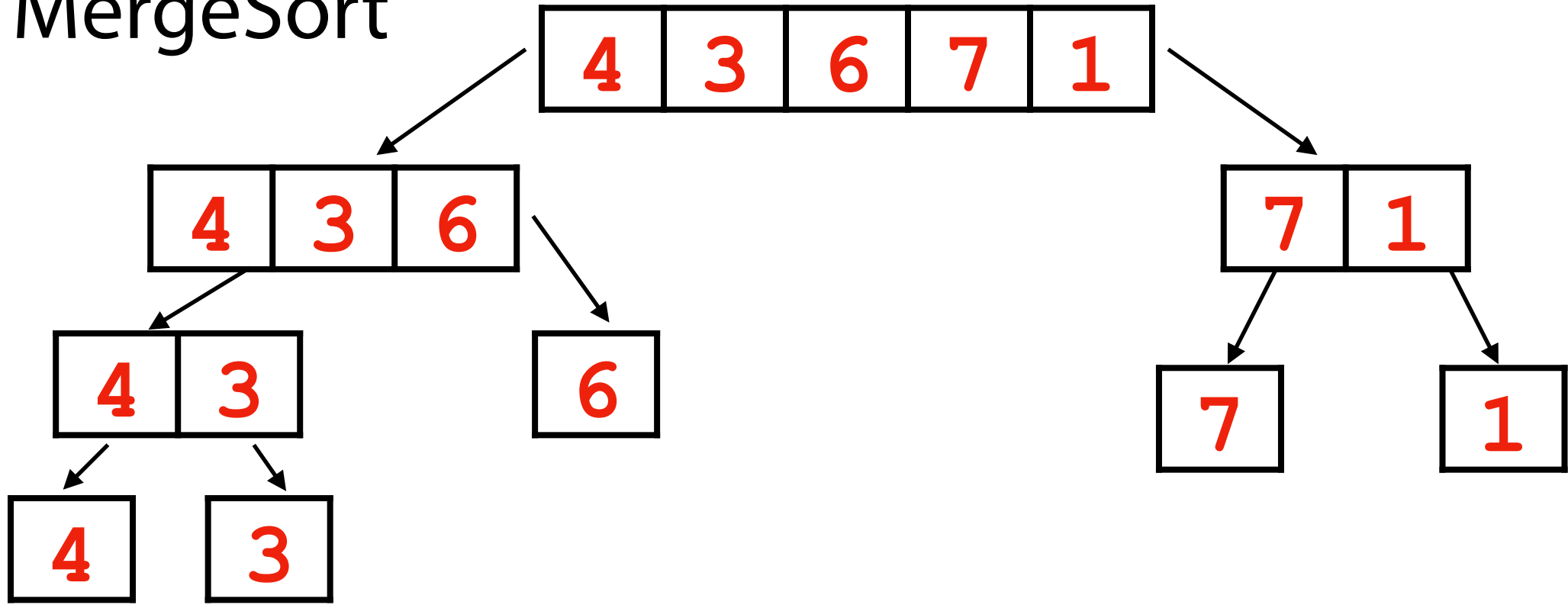
**Combining:**



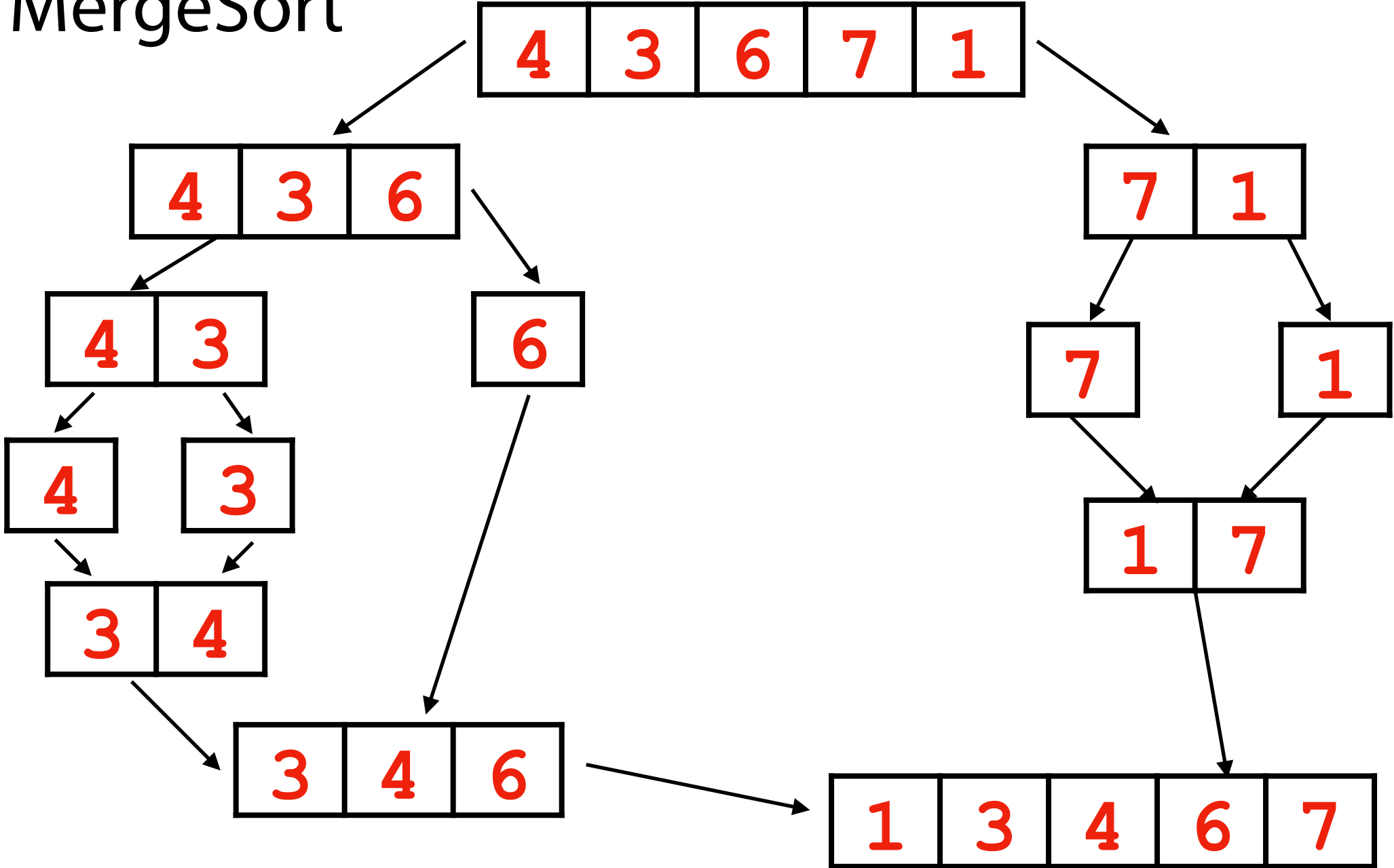
# MergeSort



# MergeSort

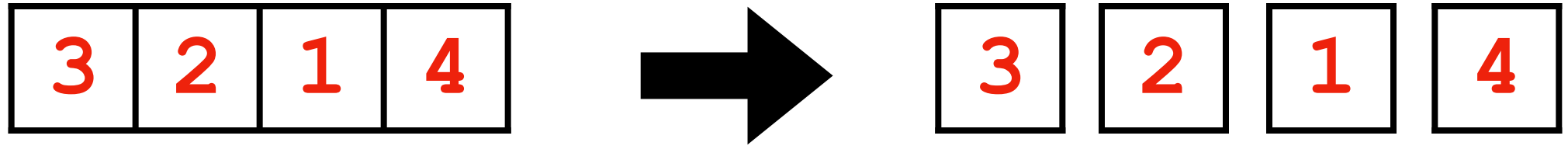


# MergeSort

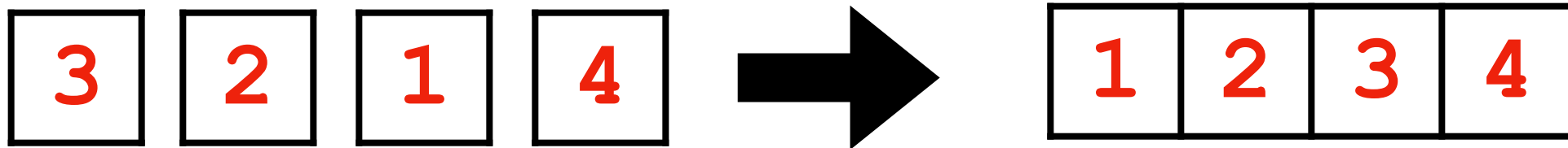


# Recursive MergeSort

1) Input list recursively split to a collection of "sorted" base cases



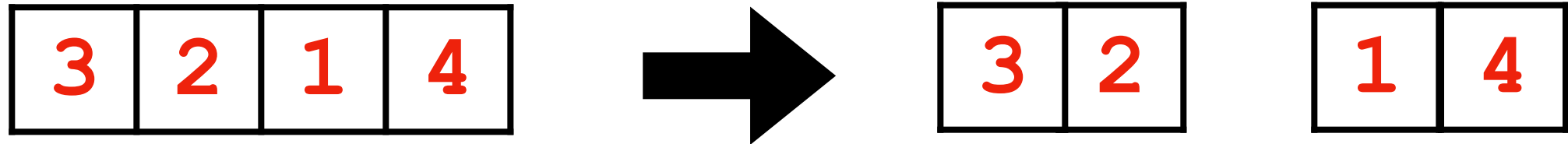
2) Sorted lists are merged back together



# Recursive MergeSort Efficiency

(large n)

1) Input list split in half

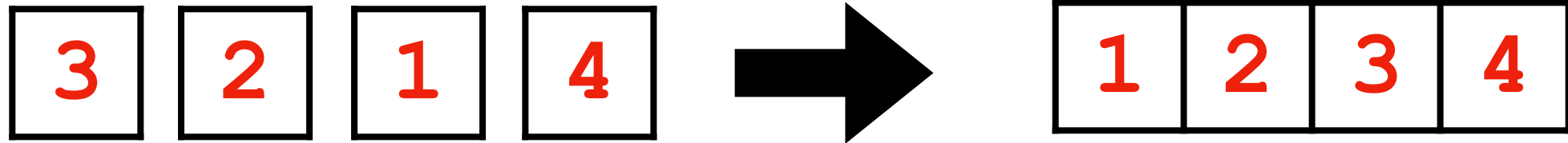


How many times do we have to split a list in half?

# Recursive MergeSort Efficiency

(large n)

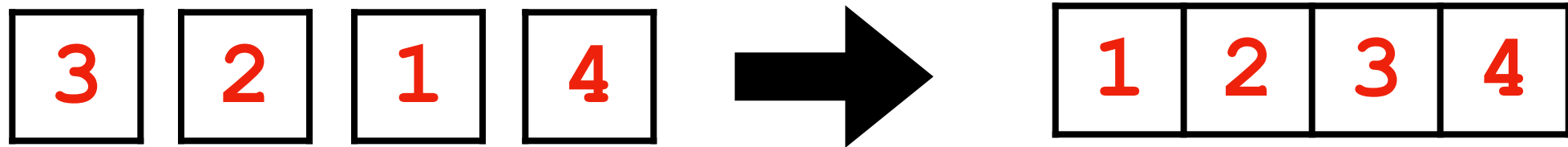
2) Sorted lists are merged back together



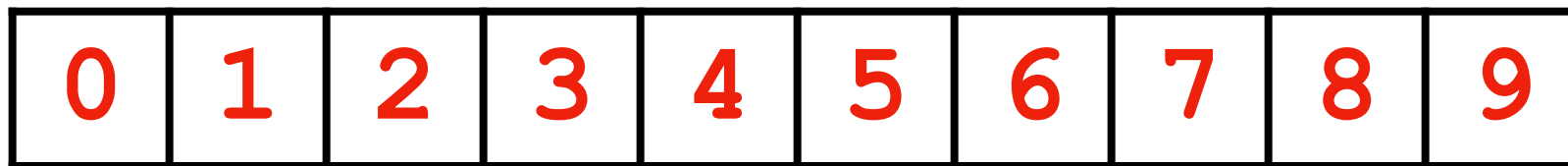
# Recursive MergeSort Efficiency

(large  $n$ )

2) Sorted lists are merged back together



**Claim:** Merging two sorted arrays can be done in  $O(n + m)$  time



# Recursive MergeSort Efficiency

(large  $n$ )

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





# Best and Worst Case mergeSort

Given the numbers 0 — 6, what is the **best** possible mergeSort input?

|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|
|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|

Given the numbers 0 — 6, what is the **worst** possible mergeSort input?

|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|
|  |  |  |  |  |  |  |
|--|--|--|--|--|--|--|

# Optimal Sorting

**Claim:** Any deterministic comparison-based sorting algorithm must perform  $O(n \log n)$  comparisons to sort  $n$  objects.

|   |   |   |
|---|---|---|
| 0 | 1 | 2 |
|---|---|---|

|   |   |   |
|---|---|---|
| 1 | 0 | 2 |
|---|---|---|

|   |   |   |
|---|---|---|
| 2 | 0 | 1 |
|---|---|---|

|   |   |   |
|---|---|---|
| 0 | 2 | 1 |
|---|---|---|

|   |   |   |
|---|---|---|
| 1 | 2 | 0 |
|---|---|---|

|   |   |   |
|---|---|---|
| 2 | 1 | 0 |
|---|---|---|

# Sorting Algorithm Tradeoffs

|               | Best Case Time | Worst Case time | Best Case Space | Worst Case Space |
|---------------|----------------|-----------------|-----------------|------------------|
| SelectionSort |                |                 |                 |                  |
| InsertionSort |                |                 |                 |                  |
| MergeSort     |                |                 |                 |                  |

# Sorting Algorithm Tradeoffs



|               | Best Case Time | Worst Case time | Best Case Space | Worst Case Space |
|---------------|----------------|-----------------|-----------------|------------------|
| SelectionSort | $O(n^2)$       | $O(n^2)$        | $O(1)$          | $O(1)$           |
| InsertionSort | $O(n)$         | $O(n^2)$        | $O(1)$          | $O(1)$           |
| MergeSort     | $O(n \log n)$  | $O(n \log n)$   | $O(n)$          | $O(n)$           |

# Bonus Content: TimSort (Python's built-in sort)

An *adaptive* sort — adjusts behavior based on input data

Take advantage of *runs* of consecutive ordered elements

Start by using insertionSort to build sorted lists of  $\leq 64$  elements

Use MergeSort once all sub-arrays are ordered

Additional heuristics speed up merging in practice

# QuickSort

|   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|
| 6 | 1 | 0 | 3 | 7 | 9 | 2 | 4 |
|---|---|---|---|---|---|---|---|

1. Choose a *pivot* value

# QuickSort

|   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|
| 6 | 1 | 0 | 3 | 7 | 9 | 2 | 4 |
|---|---|---|---|---|---|---|---|

1. Choose a *pivot* value
2. Divide the array into two partitions (larger and smaller than pivot)

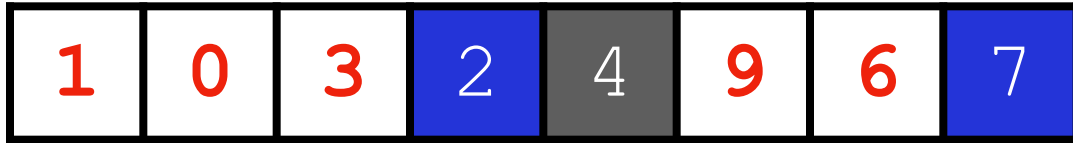
# QuickSort

|   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|
| 1 | 0 | 3 | 2 | 4 | 9 | 6 | 7 |
|---|---|---|---|---|---|---|---|

1. Choose a *pivot* value
2. Divide the array into two partitions (larger and smaller than pivot)
3. Recursively QuickSort partitions



# QuickSort



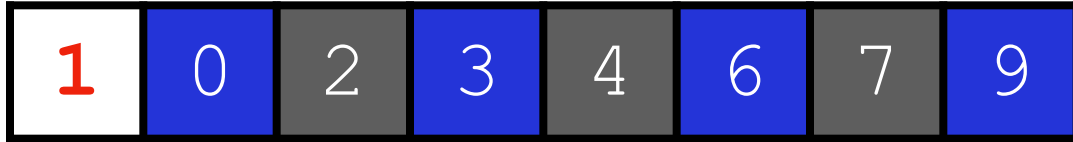
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# QuickSort



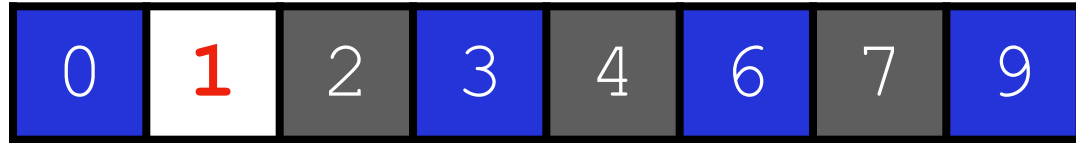
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# QuickSort



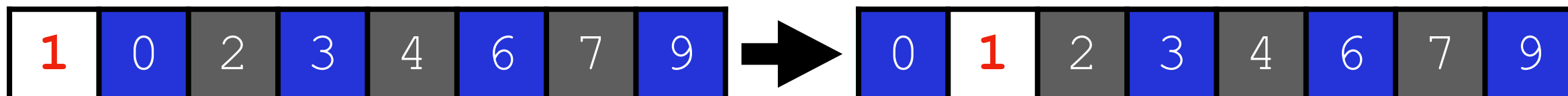
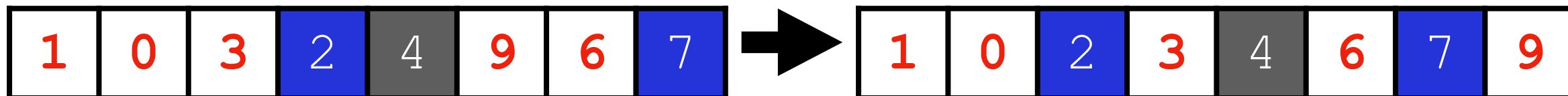
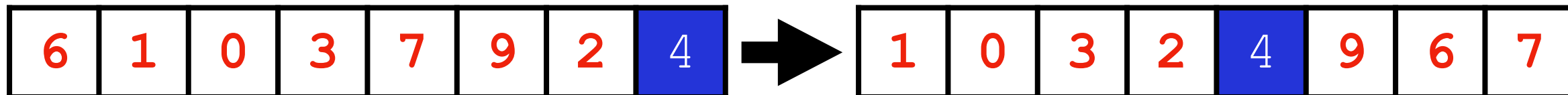
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# QuickSort



1. Choose a *pivot* value
2. Divide the array into two partitions (larger and smaller than pivot)
3. Recursively QuickSort partitions

# QuickSort



# Recursive Quicksort



|   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|
| 0 | 3 | 7 | 5 | 8 | 9 | 2 | 1 | 4 | 6 |
|---|---|---|---|---|---|---|---|---|---|

**Base Case:**

**Recursive Step:**

**Combining:**