



Ch.19 Divide and Conquer



BIRD'S-EYE VIEW

- Divide and conquer algorithms
 - Decompose a problem instance into **several smaller independent instances**
 - May be effectively run on **a parallel computer**
 - Min-max problem, matrix multiplication and so on
- This chapter
 - Develops **the mathematics** needed to analyze the complexity of divide and conquer algorithms
 - Proves that the divide and conquer algorithms for **the min-max and sorting problems are optimal**

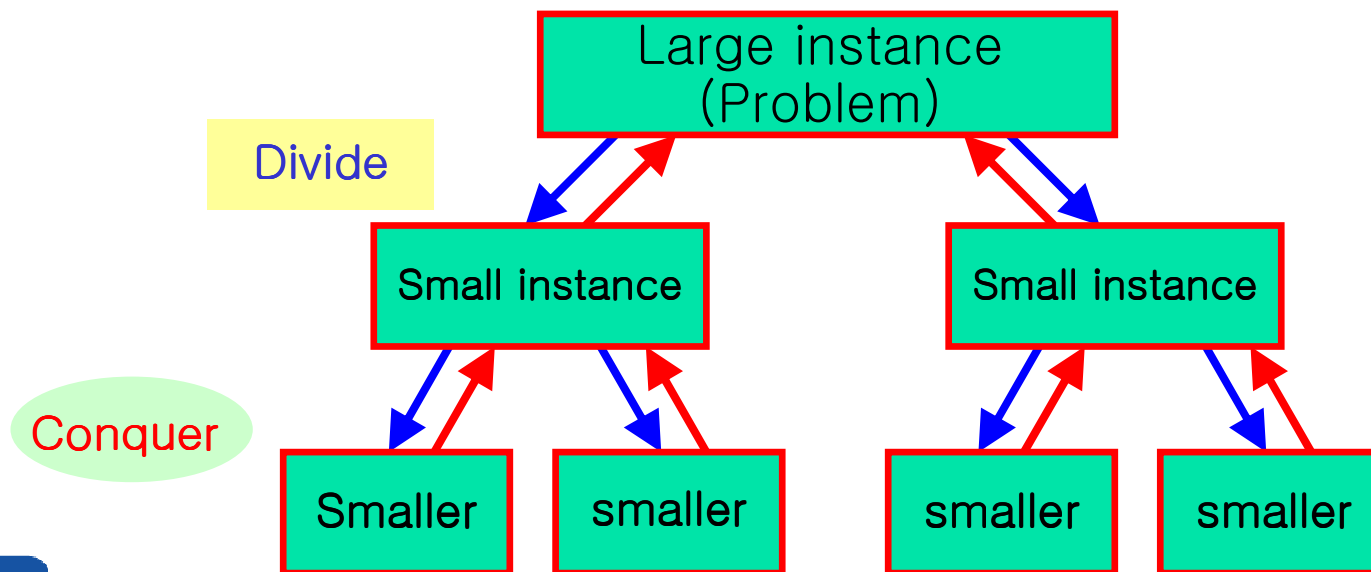


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- **The Divide and Conquer method**
 - Solving a small instance
 - Solving a large instance
- Applications
 - Divide and Conquer Sorting
 - Insertion Sort
 - Selection Sort
 - Bubble Sort
 - Merge Sort
 - Quick Sort

Divide and Conquer (1)

- Distinguish between small and large instances
- Small instances solved differently from large ones
- All instances are **non-overlapping**





Divide and Conquer (2)

- A small instance is solved using **some direct/simple strategy**
 - Sort a list that has $n (\leq 10)$ elements
 - Use count, insertion, bubble, or selection sort
 - Find the minimum of $n (\leq 2)$ elements
 - When $n = 0$, there is no minimum element
 - When $n = 1$, the single element is the minimum
 - When $n = 2$, compare the two elements and determine which is smaller
- A large instance is solved as follows:
 - Divide the large instance into $k (\geq 2)$ smaller instances
 - Solve the smaller instances somehow
 - Combine the results of the smaller instances to obtain the result for the original large instance



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Divide and Conquer Sorting (1)

- Sort n elements into nondecreasing order
- Divide-and-conquer sorting algorithm
 - If n is 1,
 - Terminate
 - Otherwise,
 - Partition the large instance of n elements into two or more small instances
 - Sort each small instances
 - Combine the sorted small instances into a single sorted instance
- Divide-and-conquer algorithms have best complexity when a large instance is divided into small instances of **approximately the same size**
 - When $k = 2$ and $n = 24$, divide into two small instances of size 12 each
 - When $k = 2$ and $n = 25$, divide into two small instances of size 13 and 12, respectively



Divide and Conquer Sorting (2)

- Partitioning Schemes
 - Partitioning the n elements into two **unbalanced** collections (i.e., $n-1$ elements & 1 element)
 - All three sort methods in this manner take $O(n^2)$ time
 - Insertion sort
 - Selection sort
 - Bubble sort
 - Partitioning the n elements into two **balanced** collections (i.e., n/k element & the rest elements into 2 groups)
 - The following methods in this manner take $O(n \log n)$ time
 - Merge sort
 - Quick sort

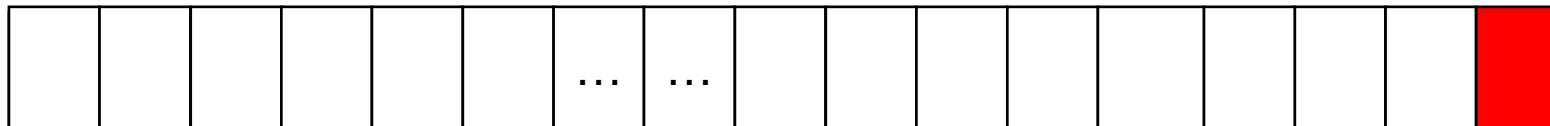


Insertion Sort by Divide & Conquer

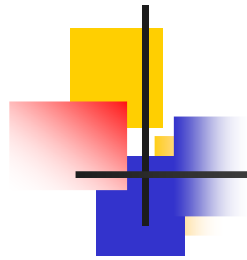
$a[0] ..$

$a[n-2]$

$a[n-1]$



- $k = 2$ divide-and-conquer sorting method
 - Complexity is $O(n^2)$
- Divide Phase
 - First $n - 1$ elements ($a[0:n-2]$) define the first small instance
 - Last element ($a[n-1]$) defines the second small instance
 - $a[0: n-2]$ is sorted recursively
- Conquer Phase
 - Combining is done by inserting $a[n-1]$ into the sorted $a[0:n-2]$
- Here we show the recursive solution, but normally implemented non-recursively



Example for Insertion Sort

Original Array →

4	3	5	1	2
---	---	---	---	---

Divide it into two arrays →

4	3	5	1	2
---	---	---	---	---

Sort the 1st array recursively →

1	3	4	5	2
---	---	---	---	---

Conquer the two arrays

: Insert the 2nd array Into the 1st array →

1	3	4	5	2
---	---	---	---	---

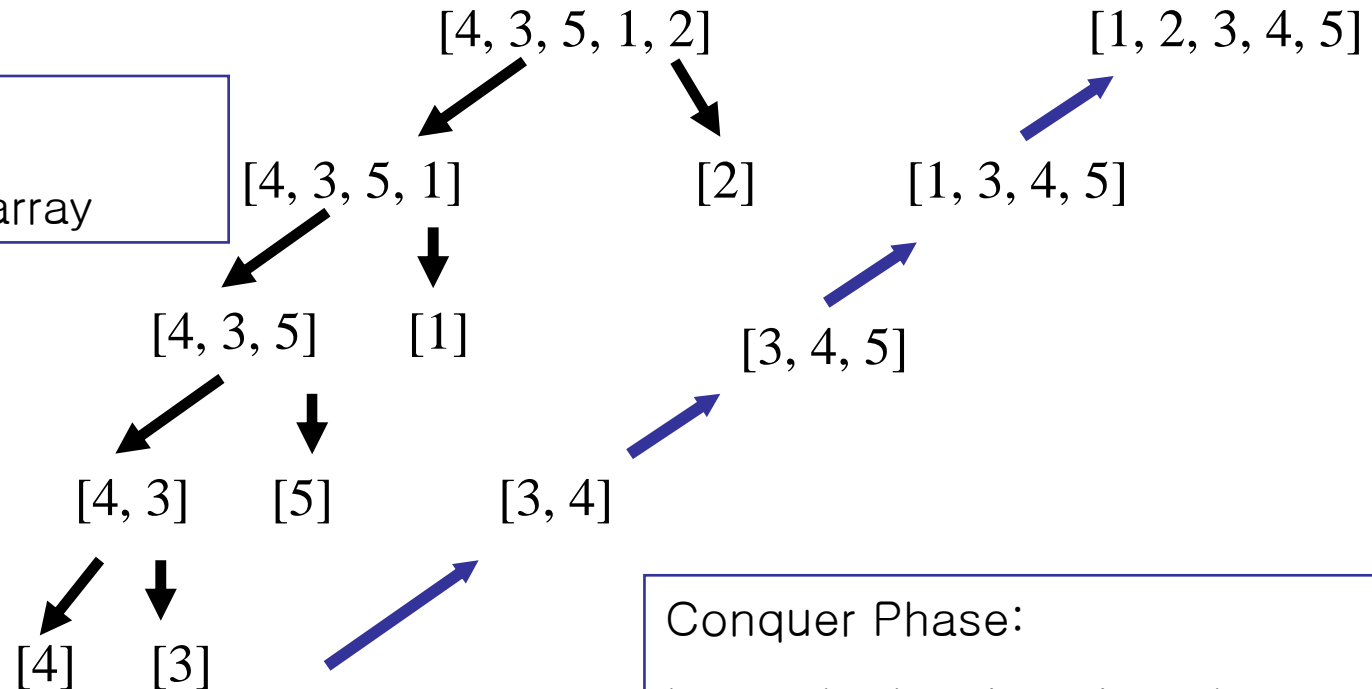
1	3	4	2	5
---	---	---	---	---

1	3	2	4	5
---	---	---	---	---

1	2	3	4	5
---	---	---	---	---

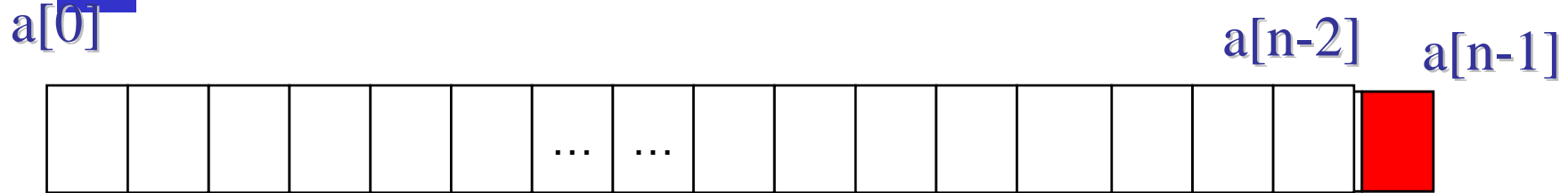
Insertion Sort Example

Divide Phase:
Just split the array

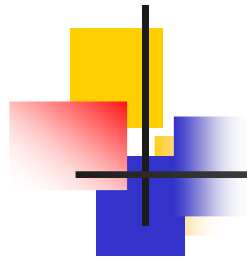


Conquer Phase:
Insert the last item into the array

Selection Sort by Divide & Conquer



- $k = 2$ divide-and-conquer sorting method
 - Complexity is $O(n^2)$
- **Divide Phase:** To divide a large collection into two smaller instances
 - First find the largest element & The largest element defines one small instance
 - The remaining $n-1$ elements define the second small instance
 - The second small instance is sorted recursively
- **Conquer Phase:** Append the first smaller instance (largest element) to the right end of the sorted second small instance
- Here we show the recursive solution, but normally implemented non-recursively



Example for Selection Sort

Original Array →

4	3	5	1	2
---	---	---	---	---

Find the largest element →

4	3	5	1	2
---	---	---	---	---

Divide it into two arrays →

4	3	1	2
---	---	---	---

5

Sort the 1st array recursively →

1	2	3	4
---	---	---	---

5

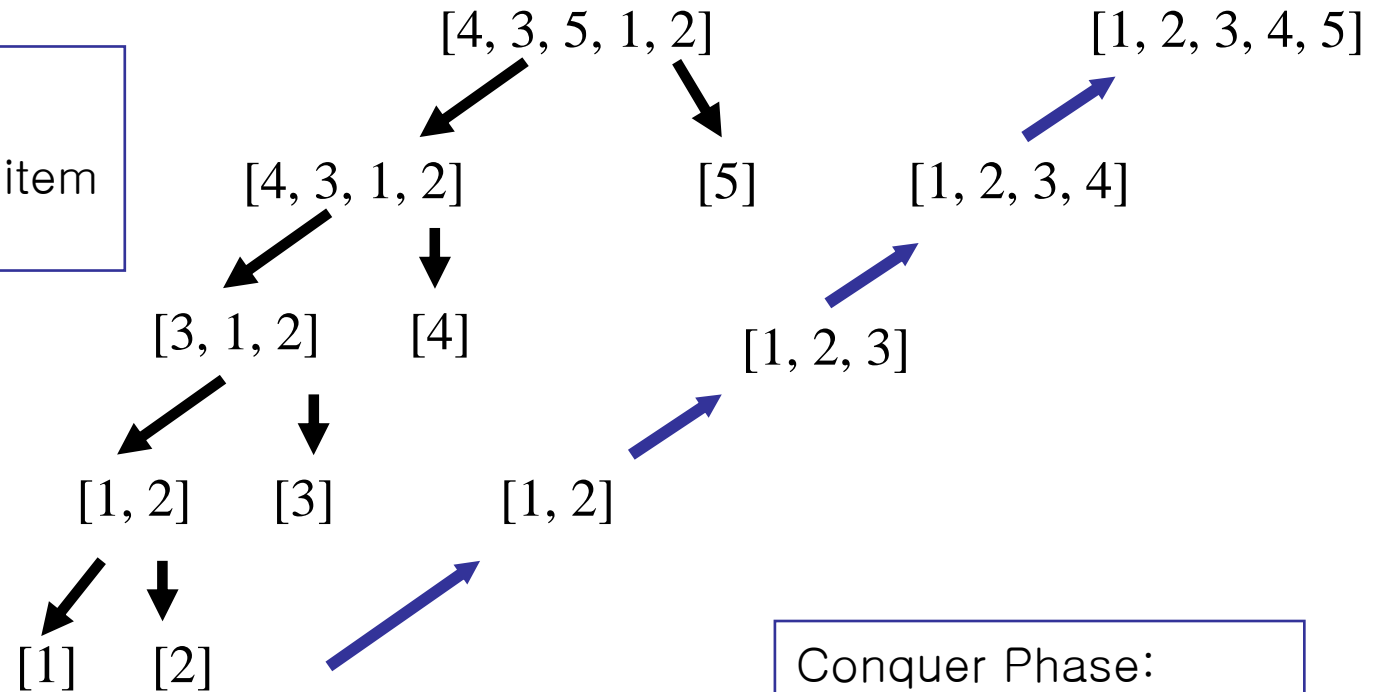
Conquer the two arrays

: Just append the 2nd array to the right of the 1st array →

1	2	3	4	5
---	---	---	---	---

Selection Sort Example

Divide Phase:
Move the largest item
by max process

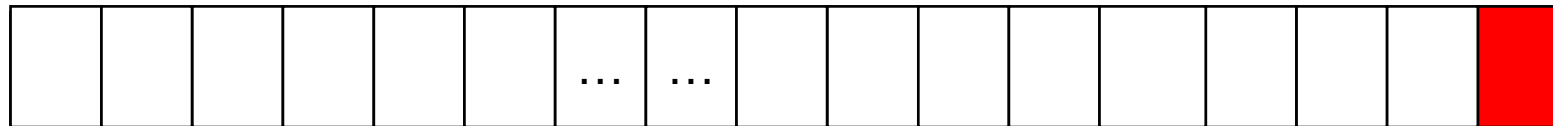


Conquer Phase:
Merge two arrays

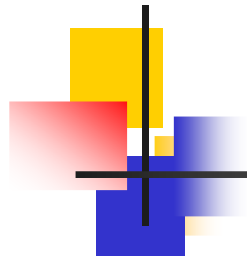
Bubble Sort by Divide & Conquer

a[0] ..

a[n-2] a[n-1]



- $k = 2$ divide-and-conquer sorting method
 - Complexity is $O(n^2)$
- **Divide Phase:** To divide a large collection into two smaller instances
 - First find the largest element by **bubbling** (a series of swapping)
 - The largest element defines one small instance
 - The remaining $n-1$ elements define the second small instance
- **Conquer Phase:** Merge two arrays
- Here we show the recursive solution, but normally implemented non-recursively



Example for Bubble Sort

Original Array →

4	3	5	1	2
---	---	---	---	---

Move the largest element to the right end by bubbling process →

3	4	5	1	2
---	---	---	---	---

3	4	5	1	2
---	---	---	---	---

3	4	1	5	2
---	---	---	---	---

3	4	1	2	5
---	---	---	---	---

Divide it into two arrays →

3	4	1	2
---	---	---	---

5

Sort the 1st array recursively →

1	2	3	4
---	---	---	---

5

Conquer the two arrays

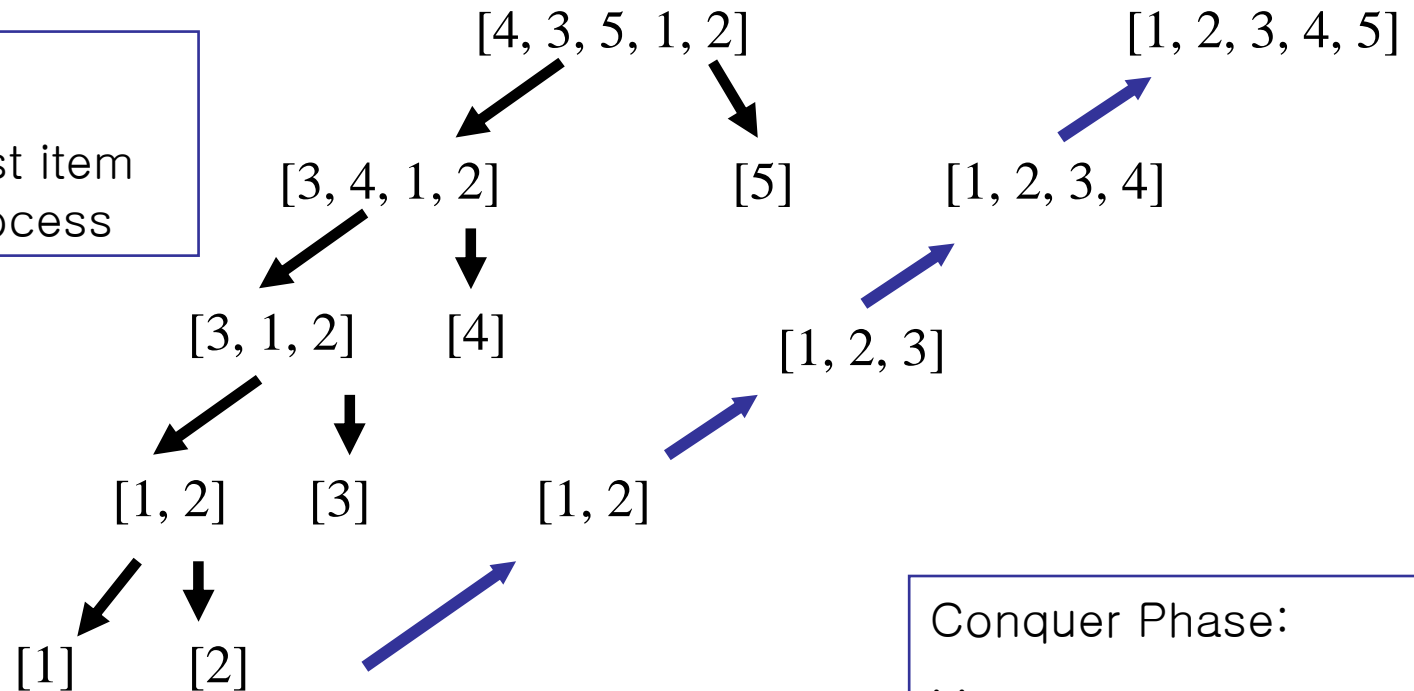
: Just append the 2nd array to the right of the 1st array →

1	2	3	4	5
---	---	---	---	---

Bubble Sort Example

Divide phase:

Move the largest item by Bubbling process



Conquer Phase:

Merge two arrays



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 - **Quick Sort**



Merge Sort by Divide and Conquer (1)

- $k = 2$ divide-and-conquer sorting method
- Divide Step
 - First $\text{ceil}(n/2)$ elements define one of the smaller instances
 - Remaining $\text{floor}(n/2)$ elements define the second smaller instance
- Conquer Step
 - Each of the two smaller instances is sorted recursively
 - The sorted smaller instances are combined using a merge process
- The complexity of merge sort is $O(n \log n)$
- Here we show the recursive solution, but normally implemented non-recursively



Merge Sort by Divide and Conquer (2)

- An Example for Merge Process

- A large instance divided into two instances (**A** and **B**) and sort them

A = (2, 5, 6) **B** = (1, 3, 8, 9, 10) **C** = ()

- Compare smallest elements of **A** and **B** and merge smaller into **C**

A = (2, 5, 6) **B** = (3, 8, 9, 10) **C** = (1)

A = (5, 6) **B** = (3, 8, 9, 10) **C** = (1, 2)

A = (5, 6) **B** = (8, 9, 10) **C** = (1, 2, 3)

A = (6) **B** = (8, 9, 10) **C** = (1, 2, 3, 5)

A = () **B** = (8, 9, 10) **C** = (1, 2, 3, 5, 6)

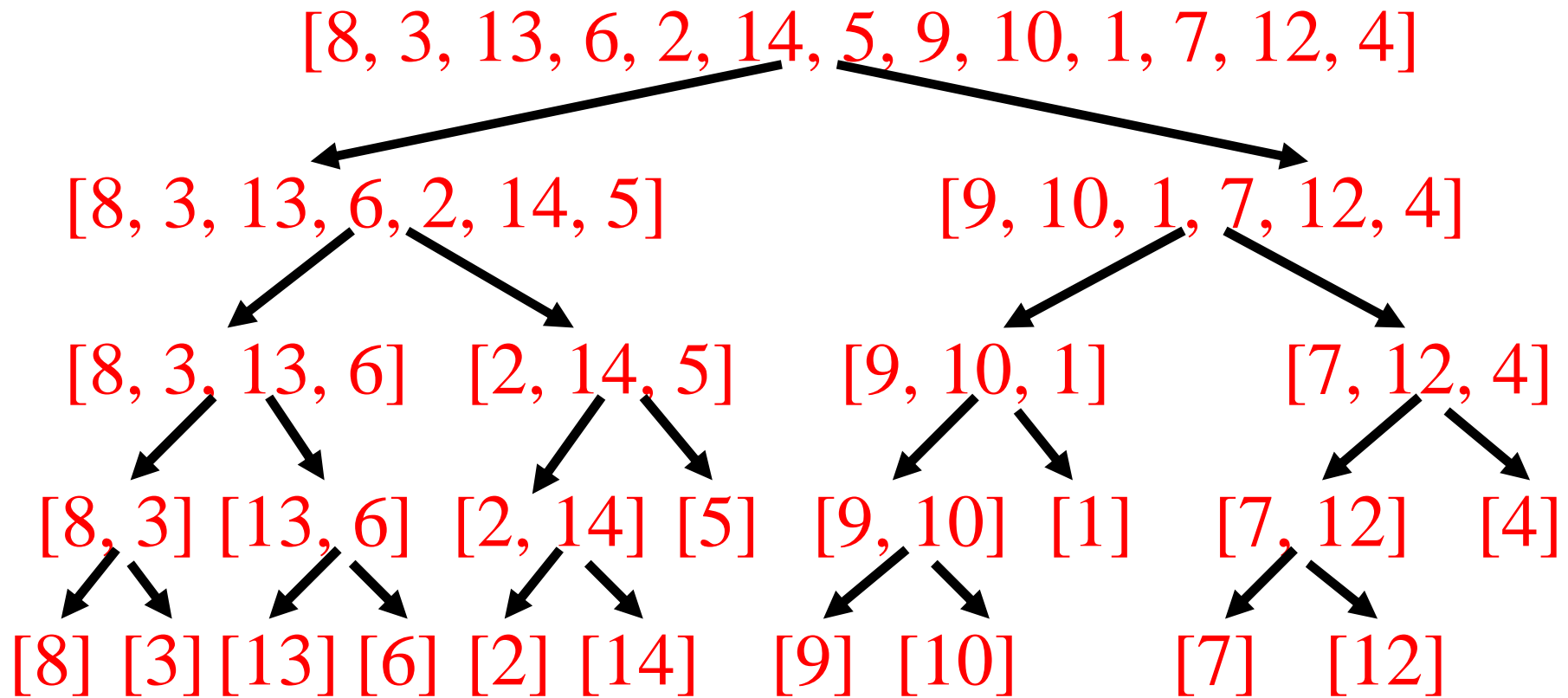
- When one of **A** and **B** becomes empty, append the other list to **C**

A = () **B** = () **C** = (1, 2, 3, 5, 6, 8, 9, 10)

- $O(1)$ time needed to move an element into **C**
- Total time is $O(n + m)$, where **n** and **m** are the number of elements initially in **A** and **B**

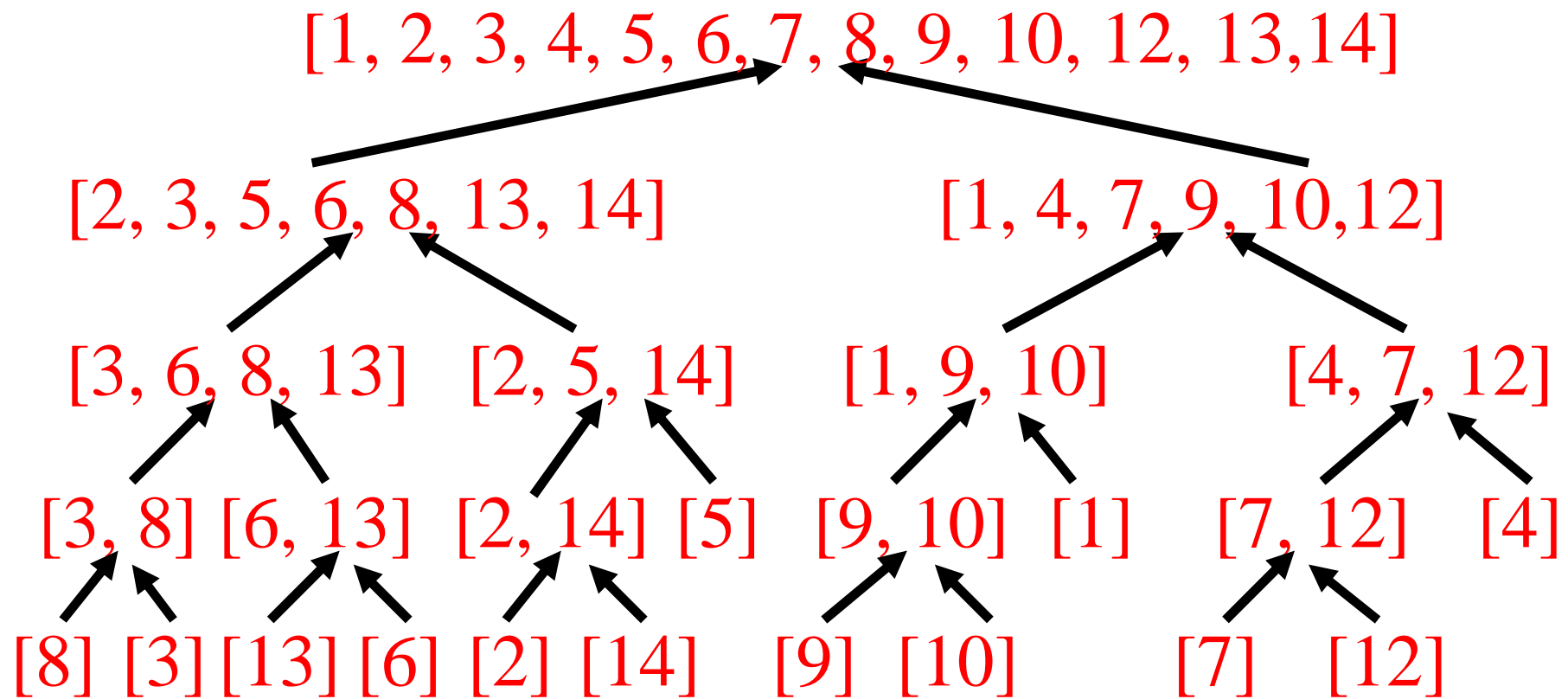
Merge Sort: Example (1)

- Divide Phase



Merge Sort: Example (2)

- Conquer Phase: all sub components are sorted





Merge Sort Analysis

- Number of leaf nodes is n
- Number of nonleaf nodes is $n-1$

- Downward pass over the recursion tree
 - Divide large instances into small ones
 - $O(1)$ time at each node
 - $O(n)$ total time at all nodes

- Upward pass over the recursion tree
 - Merge pairs of sorted lists
 - $O(n)$ time merging at each level that has a nonleaf node
 - Number of levels is $O(\log n)$
 - Total time is $O(n \log n)$

Quick Sort by Divide and Conquer

- Small instance has $n \leq 1$.
 - So, Every small instance is a sorted instance
- To sort a large instance, select a **pivot** element from out of the n elements
- Partition the n elements into 3 groups **left**, **middle** and **right**
 - The **middle** group contains only the **pivot** element
 - All elements in the **left** group are \leq **pivot**
 - All elements in the **right** group are \geq **pivot**
- Sort **left** and **right** groups recursively
- combine **left** group, **middle** group and **right** group

6	2	8	5	11	10	4	1	9	7	3
---	---	---	---	----	----	---	---	---	---	---

Use 6 as the pivot

2	5	4	1	3	6	7	9	10	11	8
---	---	---	---	---	---	---	---	----	----	---

Sort left and right groups recursively

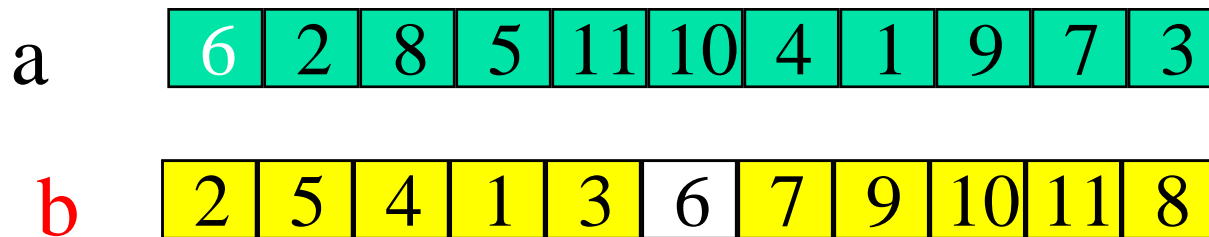


Quick Sort by Divide and Conquer: Choice of Pivot

- **Leftmost** element in list that is to be sorted
 - When sorting $a[6:20]$, use $a[6]$ as the pivot
 - Text implementation does this
- **Randomly** select one of the elements to be sorted as the pivot
 - When sorting $a[6:20]$, generate a random number r in the range $[6, 20]$.
 - Use $a[r]$ as the pivot
- **Median-of-Three rule**. From the leftmost, middle, and rightmost elements of the list to be sorted, select the one with median key as the pivot
 - When sorting $a[6:20]$, examine $a[6]$, $a[13]$ ($((6+20)/2)$), and $a[20]$.
 - Select the element with median (i.e., middle) key
 - If $a[6].key = 30$, $a[13].key = 2$, and $a[20].key = 10$, $a[20]$ becomes the pivot
 - If $a[6].key = 3$, $a[13].key = 2$, and $a[20].key = 10$, $a[6]$ becomes the pivot
 - If $a[6].key = 30$, $a[13].key = 25$, and $a[20].key = 10$, $a[13]$ becomes the pivot

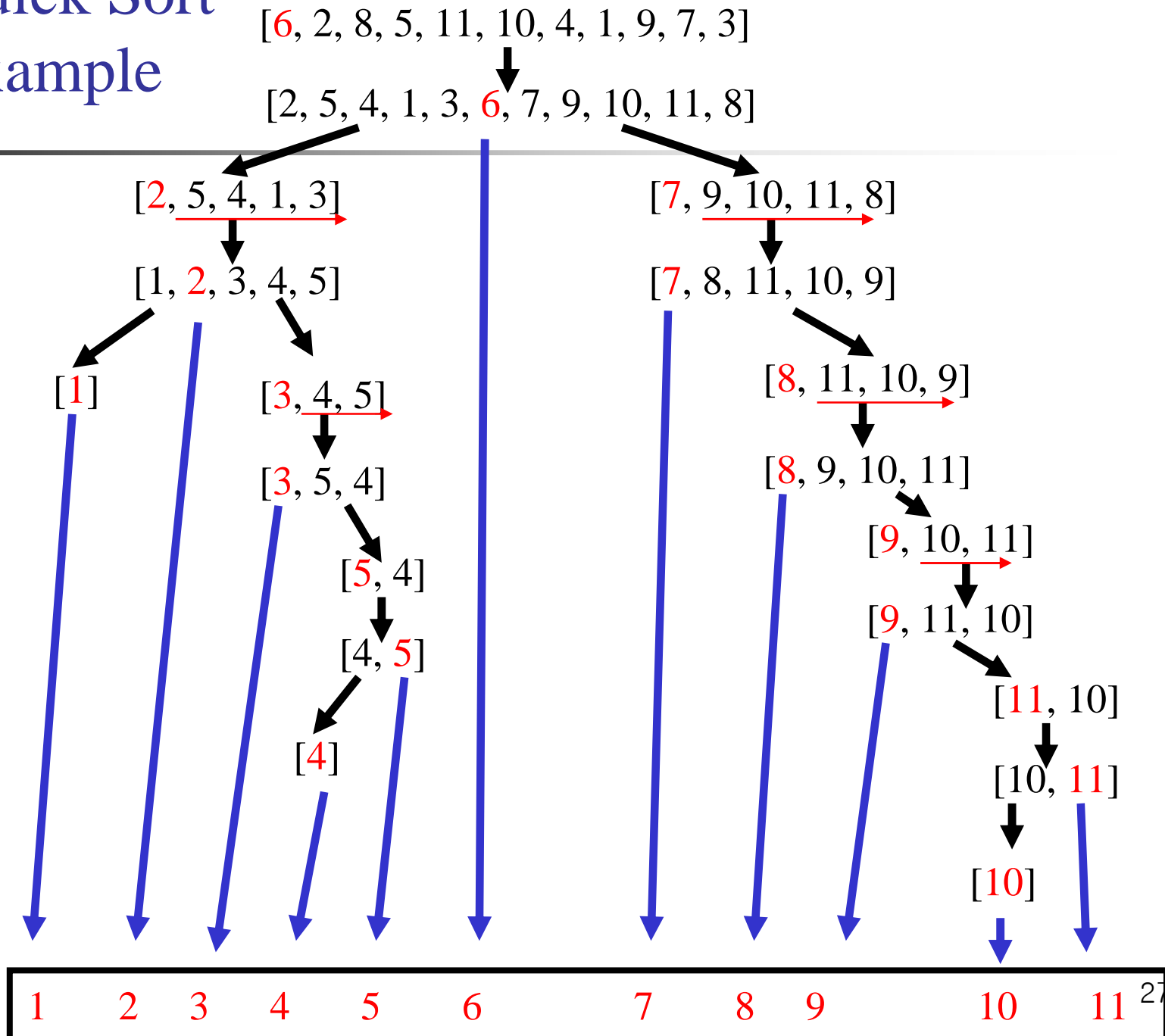
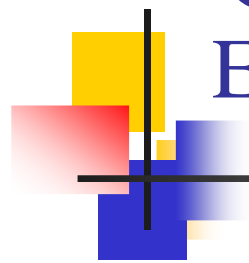
Quick Sort by Divide and Conquer: Partitioning

- Sort $a = [6, 2, 8, 5, 11, 10, 4, 1, 9, 7, 3]$
- Suppose the leftmost element “6” is the **pivot**
- When another array b is available:
 - Scan a from left to right (omit the pivot in this scan), placing elements \leq **pivot** at **the left end** of b and the remaining elements at **the right end** of b
 - The pivot is placed at the remaining position of the b

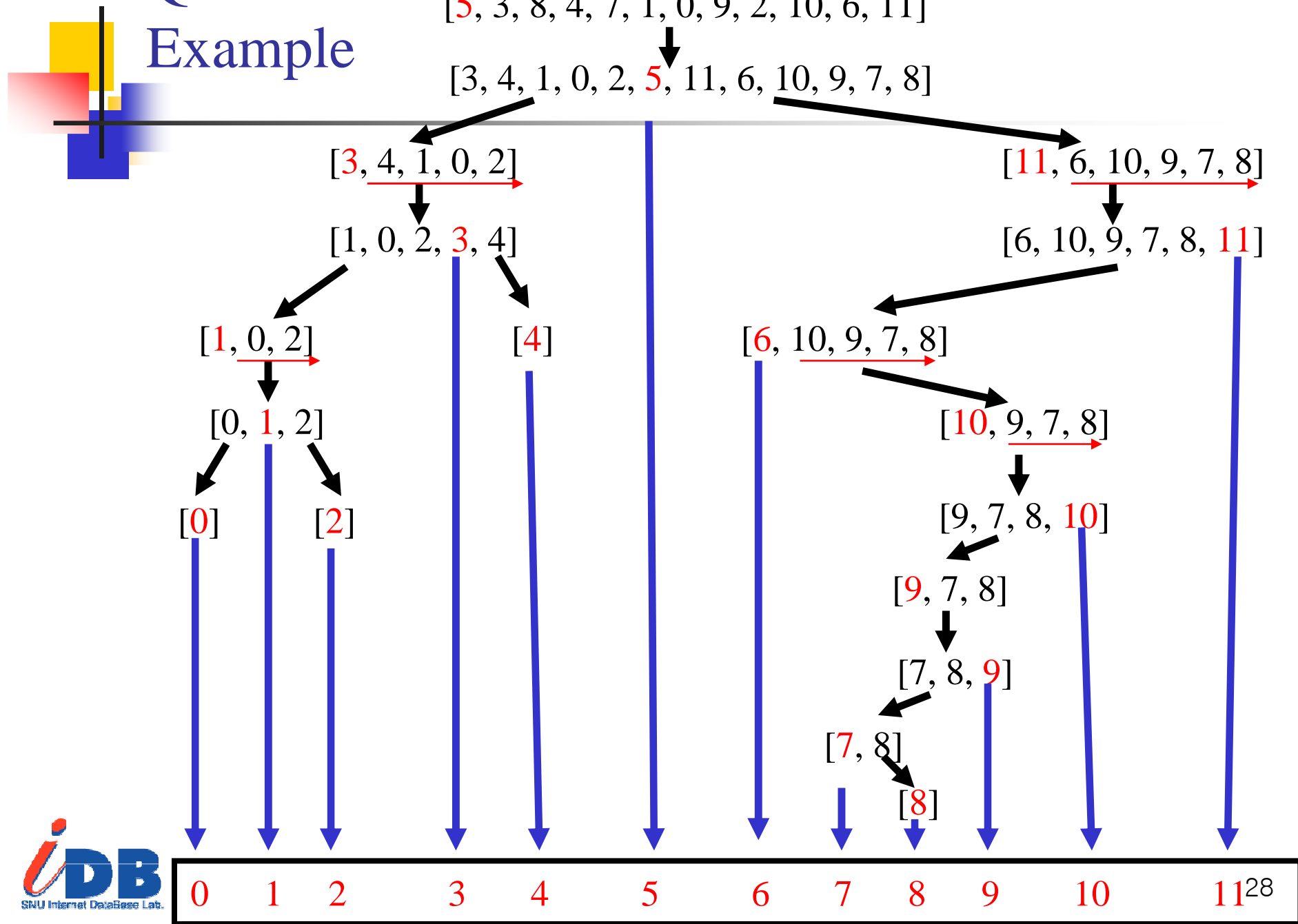


Sort left and right groups recursively

Quick Sort Example



Quick Sort Example





Time Complexity of Quick Sort

- $O(n)$ time to partition an array of n elements
- Let $t(n)$ be the time needed to sort n elements
 - $t(0) = t(1) = c$, where c is a constant
 - When $t > 1$,
 $t(n) = t(\text{left}) + t(\text{right}) + dn$, where d is a constant
 - $t(n)$ is maximum when either $|\text{left}| = 0$ or $|\text{right}| = 0$ following each partitioning
- Overall Time Complexity
 - The worst-case computing time for quick sort is $\Theta(n^2)$
 - When left is always empty
 - The best-case computing time for quick sort is $\Theta(n \log n)$
 - When left and right are always of about the same size
 - The average complexity of quick sort is also $\Theta(n \log n)$
 - Theorem 19.2 in your textbook



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