

SORTING

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Sorting

- Definition:
- Input: $\langle a_1, a_2, \dots, a_n \rangle$ a sequence of n numbers
- Output: $\langle a'_1, a'_2, \dots, a'_n \rangle$ is a permutation (reordering) of the original sequence, such that $a'_1 \leq a'_2 \leq \dots \leq a'_n$
- In reality, a_i is the key of a record (of multiple fields) (e.g., student ID)
- In a record, the data fields other than the key is called **satellite data**
- If satellite data is large in size, we will only sort the pointers pointing to the records. (avoiding moving the data)

Applications of Sorting

- Example 1: Looking for an item in a list
- Q: How do we look for an item in an **unsorted** list?
- A: We likely can only linearly traverse the list from the beginning.
- $\rightarrow O(n)$
- Q: What if it is sorted?
- A: We can do binary search $\rightarrow O(\log n)$
- But, how much time do we need for sorting? (pre-processing)

Applications of Sorting

- Example 2:
- Compare to see if two lists are identical (list all different items)
- The two lists are n and m in length

- Q: What if they are **unsorted**?
- Compare the 1st item in list 1 with $(m-1)$ items in list 2
- Compare the 2nd item in list 1 with $(m-1)$ items in list 2
- ...
- Compare the n -th item in list 1 with $(m-1)$ items in list 2
- $O(nm)$ time is needed

- Q: What if they are sorted?
- A: $O(n + m)$

- Again, do not forget we also need time for sorting. But, how much?

Categories of Sorting Algo.

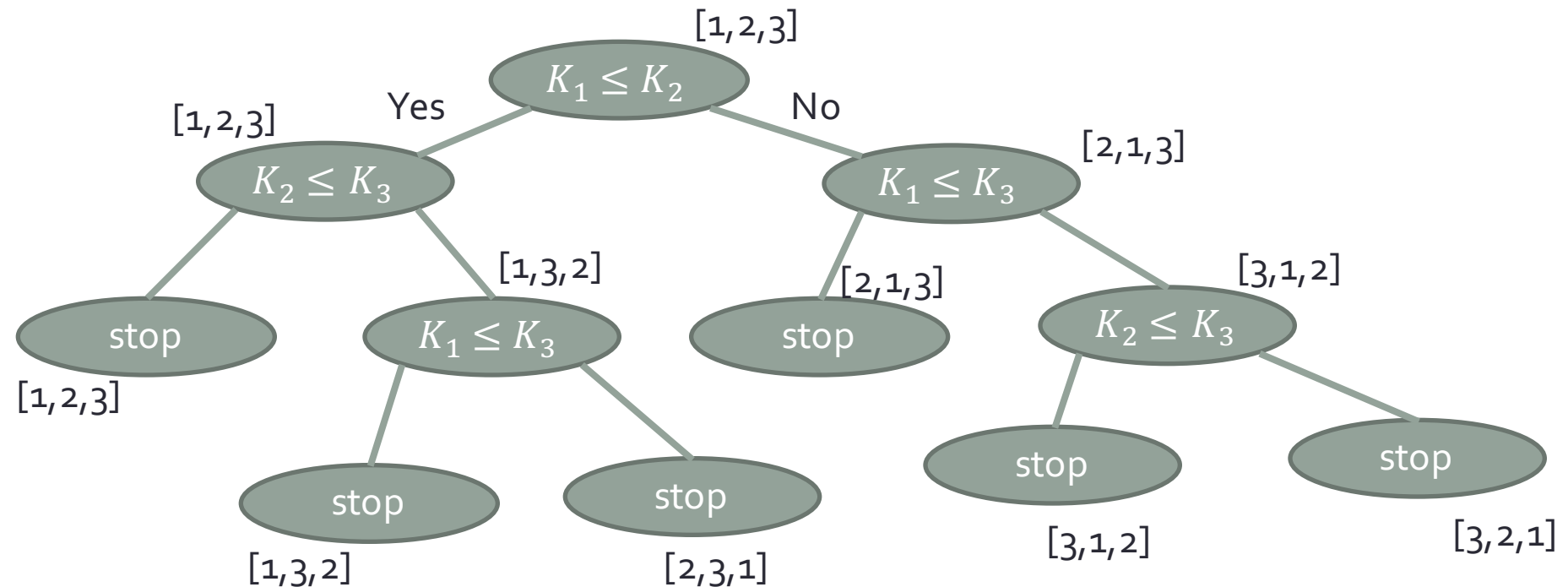
- Internal Sort:
 - Place all data in the memory
- External Sort:
 - The data is too large to fit it entirely in the memory.
 - Some need to be temporarily placed onto other (slower) storage, e.g., hard drive, flash disk, network storage, etc.
- In this lecture, we will only discuss **internal sort**.
- Storage is **cheap** nowadays. In most cases, only internal sort is needed.

Some terms related to sorting

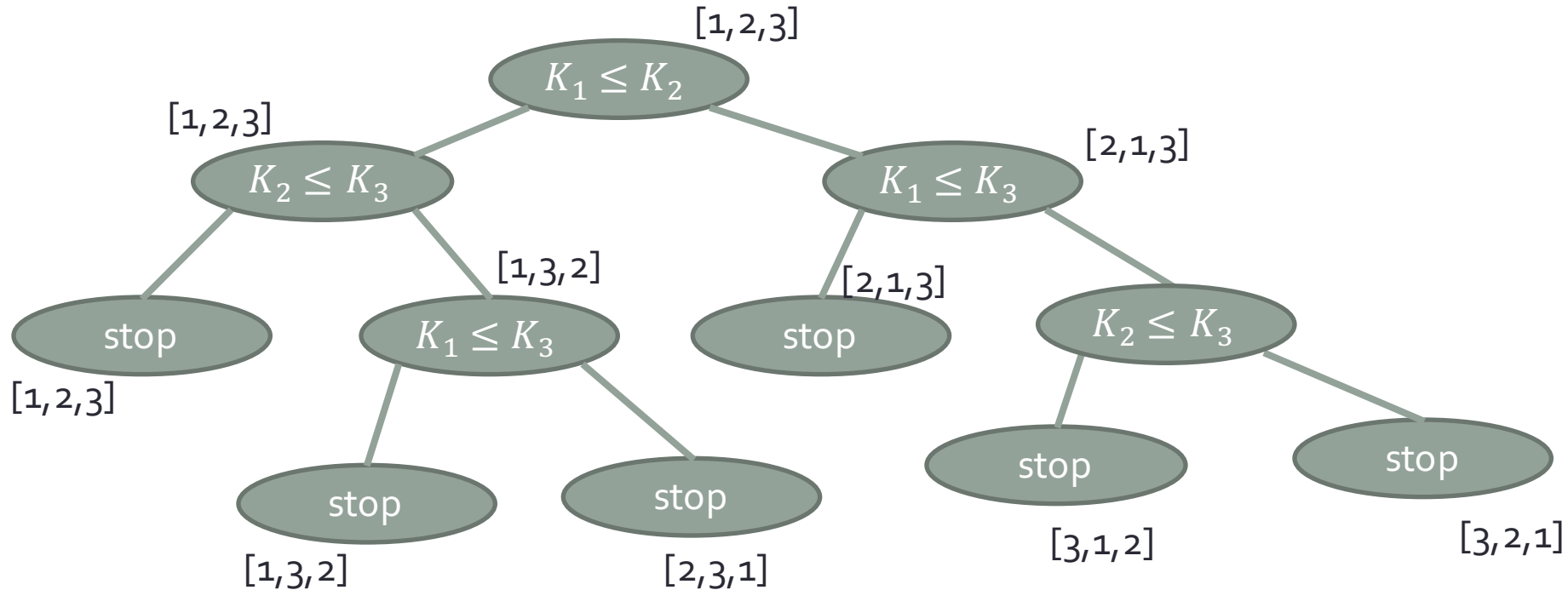
- **Stability:**
 - If $a_i = a_j$ (equal key value) , then they maintain the same order before and after sorting.
- **In-place:**
 - Directly sort the keys at **their current memory locations**. Therefore, only $O(1)$ additional space is needed for sorting.
- **Adaptability:**
 - If **part of the sequence is sorted**, then the time complexity of the sorting algorithm reduces.

How fast can we sort?

- Assumption: compare and swap
- Compare: compare two items in the list
- Swap: Swap the locations of these two items
- How much time do we need in the worst case?



Decision tree for sorting



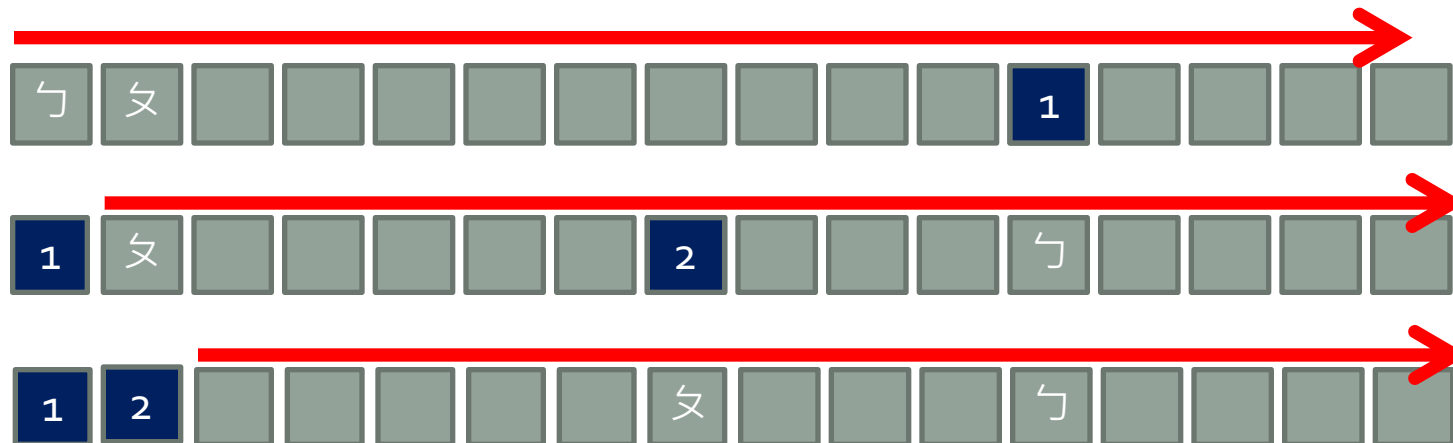
- Every node represents a comparison & swap
- Sorting is completed when reaching the leaf
- How many leaves?
- $n!$, since there are that many possible permutations

How fast can we sort?

- 所以, worst case所需要花的時間, 為此binary tree的height.
- 如果decision tree height為 h , 有 l 個leaves
- $l \geq n!$, we have a least $n!$ outcomes (leaves)
- $l \leq 2^h$, a binary tree (decision tree) of height h has at most 2^{h-1} leaves
- $2^h \geq l \geq n!$
- $h \geq \log_2 n!$
- $n! = n(n-1)(n-2) \dots 3 \cdot 2 \cdot 1 \geq \left(\frac{n}{2}\right)^{\frac{n}{2}}$
- $\log_2 n! \geq \log_2 \left(\frac{n}{2}\right)^{\frac{n}{2}} = \frac{n}{2} \log_2 \frac{n}{2} = \Omega(n \log n)$
- Summary: Any “comparison-based” sorting algorithm has worst-case time complexity of $\Omega(n \log n)$.

Review: Selection Sort

- Select the smallest, move it to the first position.
- Select the second smallest, move it to the second position.
-
- The last item will automatically be placed at the last position.

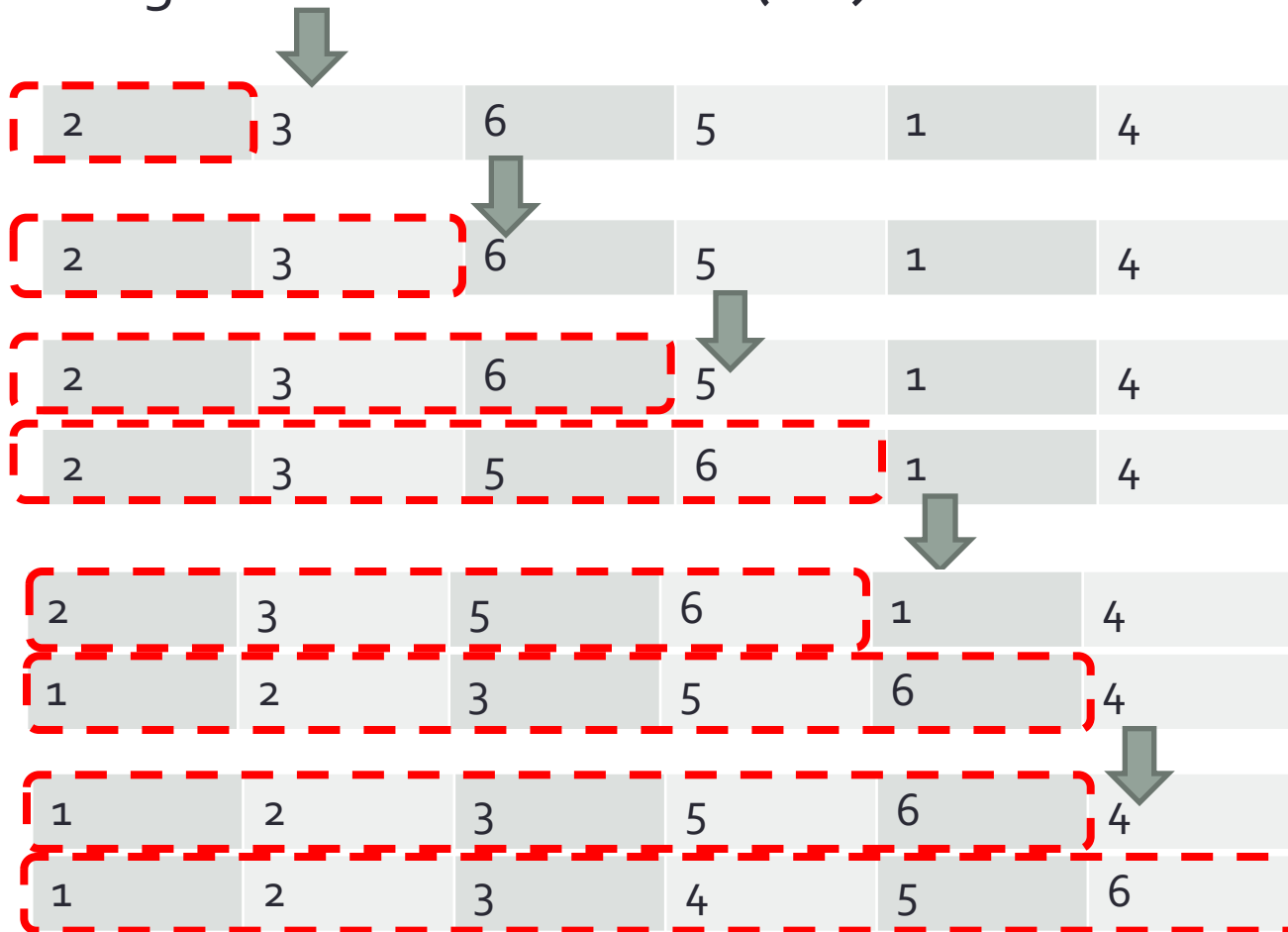


Review: Selection Sort

- Selection sort does not change the execution of the algorithm due to the current conditions.
- Always going through the entire array in each iteration.
- Therefore, its best-case, worst-case, average-case running time are all $O(n^2)$
- **Not adaptive!**
- **In-place**

Insertion Sort

- In each iteration, add one item to a **sorted list of i item**.
- Turning it into a **sorted list of $(i+1)$ item**



Pseudo code

INSERTION-SORT(A)

```
1  for  $j = 2$  to  $A.length$ 
2       $key = A[j]$ 
3      // Insert  $A[j]$  into the sorted
   sequence  $A[1..j - 1]$ .
4       $i = j - 1$ 
5      while  $i > 0$  and  $A[i] > key$ 
6           $A[i + 1] = A[i]$ 
7           $i = i - 1$ 
8       $A[i + 1] = key$ 
```

Insertion Sort

- Q: How much time is needed?
- A: In the worst case, the item needs to be placed at the beginning for each and every iteration.
- (Spending time linear to the size of sorted part)
- $\sum_1^{n-1} i = \frac{n(n-1)}{2} = O(n^2)$
- Average-case complexity: $O(n^2)$. (Why?)
- Possible variation: (do those improve the time complexity?)
- 1. Use binary search to look for the location to insert.
- 2. Use linked list to store the items. Then moving takes only $O(1)$!

What's good about insertion sort

- Simple (small constant in time complexity representation)
 - Good choice when sorting a small list
- Stable
- In-place
- Adaptive
 - Example: In $\langle 1, 2, 5, 3, 4 \rangle$, only two inversions $\langle 5, 3 \rangle$, $\langle 5, 4 \rangle$.
 - The running time for insertion sort: $O(n+d)$, d is the number of inversions
Best case: $O(n)$ (No inversion, **sorted**)
- Online:
No need to know all the numbers to be sorted. Possible to sort and take input at the same time.

Merge Sort

- Use **Divide-and-Conquer** strategy
- Divide-and-Conquer:
 - Divide: Split the big problem into small problems
 - Conquer: Solve the small problems
 - Combine: Combine the solutions to the small problems into the solution of the big problems.
- Merge sort:
 - Divide: Split the n numbers into two sub-sequences of $n/2$ numbers
 - Conquer: Sort the two sub-sequences (use recursive calls to delegate to the clones)
 - Combine: Combine the two **sorted sub-sequences** into the one **sorted** sequence

Merge Sort

MERGE-SORT(A, p, r)

```
1  if  $p < r$ 
2       $q = \lfloor (p + r) / 2 \rfloor$ 
3      MERGE-SORT( $A, p, q$ )
4      MERGE-SORT( $A, q + 1, r$ )
5      MERGE( $A, p, q, r$ )
```

Divide

Conquer x2

Combine

Merge Sort

A[]: the array to be sorted
temp: temporarily storage
left,right: the left & right indices of the range to be sorted.

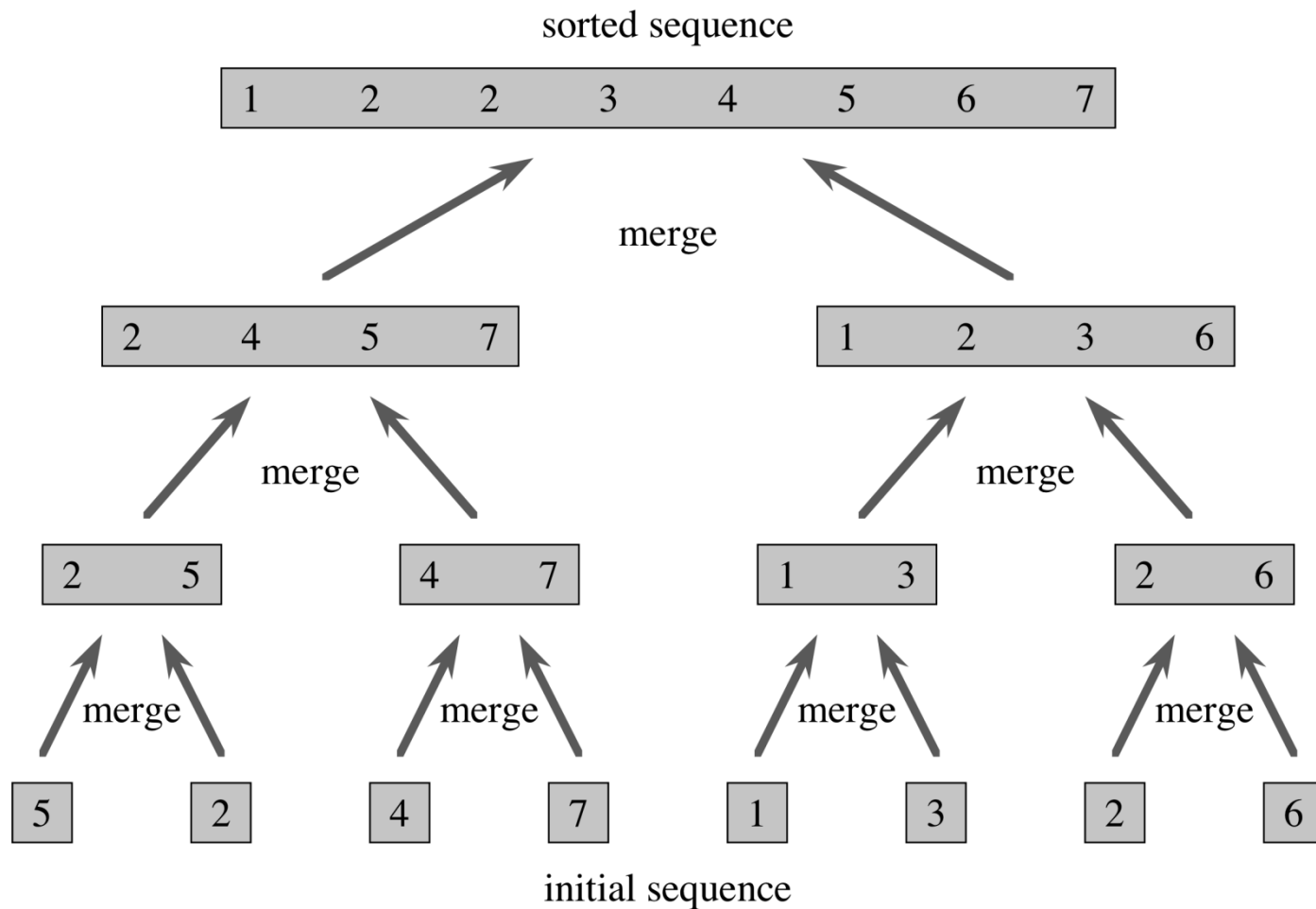
```
void Mergesort(int A[], int temp, int left, int right) {  
    int mid;  
    if (right > left) {  
        mid=(right+left)/2;  
        Mergesort(A,temp,left,mid);  
        Mergesort(A,temp,mid+1,right);  
        Merge(A,temp,left,mid+1,right);  
    }  
}
```

Divide

Conquer

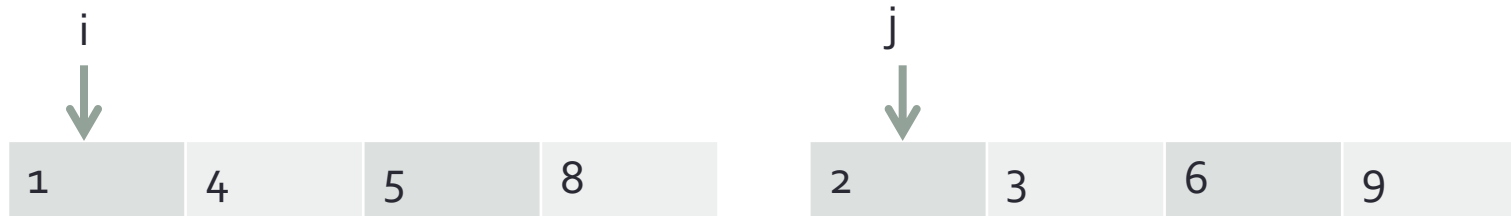
Combine

Merge Sort: Example



How to combine (merge)?

Temporary storage



Original array



- Running time: $O(n_1 + n_2) = O(n)$, n_1 和 n_2 are the lengths of the two sub-sequences.
- A temporary storage of size $O(n)$ is needed during the merge process

Implementation: Merge

MERGE(A, p, q, r)

```
1   $n_1 = q - p + 1$ 
2   $n_2 = r - q$ 
3  let  $L[1..n_1 + 1]$  and  $R[1..n_2 + 1]$  be new arrays
4  for  $i = 1$  to  $n_1$ 
5       $L[i] = A[p + i - 1]$ 
6  for  $j = 1$  to  $n_2$ 
7       $R[j] = A[q + j]$ 
8   $L[n_1 + 1] = \infty$ 
9   $R[n_2 + 1] = \infty$ 
10  $i = 1$ 
11  $j = 1$ 
12 for  $k = p$  to  $r$ 
13     if  $L[i] \leq R[j]$ 
14          $A[k] = L[i]$ 
15          $i = i + 1$ 
16     else  $A[k] = R[j]$ 
17          $j = j + 1$ 
```

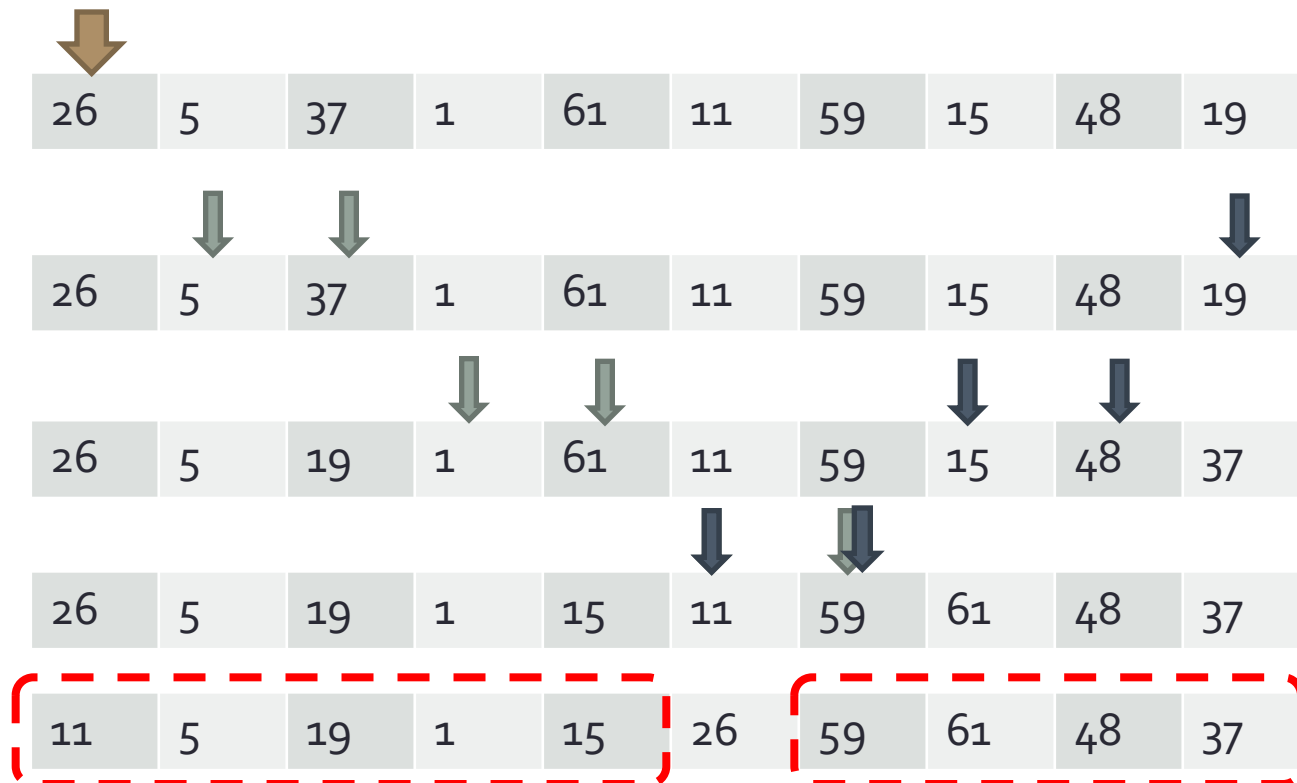
Merge sort

- Every item to be sorted is processed once per “pass” $\rightarrow O(n)$
- How many passes is needed?
- The length of the sub-sequence **doubles** every pass, and finally it becomes the large sequence of n numbers
- Therefore, $\lceil \log_2 n \rceil$ passes.
- Total running time: $O(n \log_2 n) = O(n \log n)$
- Worst-case, best-case, average-case: $O(n \log n)$
(Not adaptive)

- Not in-place: need additional storage for sorted sub-sequences
- Additional space: $O(n)$

Quick Sort

- Find a pivot(支點), manipulate the locations of the items so that:
 - (1) all items to its left is smaller or equal (**unsorted**),
 - (2) all items to its right is larger
- Recursively call itself to sort the left and right sub-sequences.



Pseudo Code

QUICKSORT(A, p, r)

1 **if** $p < r$

2 $q = \text{PARTITION}(A, p, r)$

Divide

3 QUICKSORT($A, p, q - 1$)

4 QUICKSORT($A, q + 1, r$)

Conquer x2

No Combine!

Quick Sort

11	5	19	1	15	26	59	61	48	37
1	5	11	19	15	26	59	61	48	37
1	5	11	19	15	26	59	61	48	37
1	5	11	15	19	26	59	61	48	37
1	5	11	15	19	26	59	61	48	37
1	5	11	15	19	26	48	37	59	61
1	5	11	15	19	26	37	48	59	61
1	5	11	15	19	26	37	48	59	61

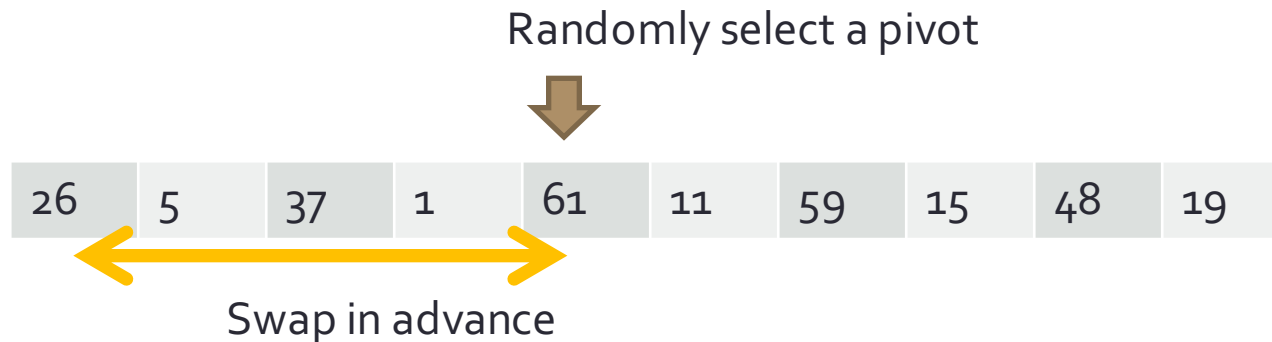
Quick Sort: Worst & Best case

- But worst case running time is still $O(n^2)$
- Q: Give an example which produces worst-case running time for the quick sort algorithm.
- In this case: running time is $O(n^2)$

- Best case?
- Pivot can split the sequence into two sub-sequences of equal size.
- Therefore, $T(n) = 2T(n/2) + O(n)$
- $T(n) = O(n \log n)$

Randomized Quick Sort

- Avoid worst case to happen frequently
- Randomly select a pivot (not always the leftmost key)
- Reduce the probability of the worst case
- However, worst case running time is still $O(n^2)$



Average running time

- Better if the selection of pivot can evenly split the sequence into two sub-sequences of equal size
- Why the average running time is close to the best-case one?
- 假設很糟的一個狀況: 每次都分成1:9

Time needed for the "9/10 subsequence"

Time needed for partitioning

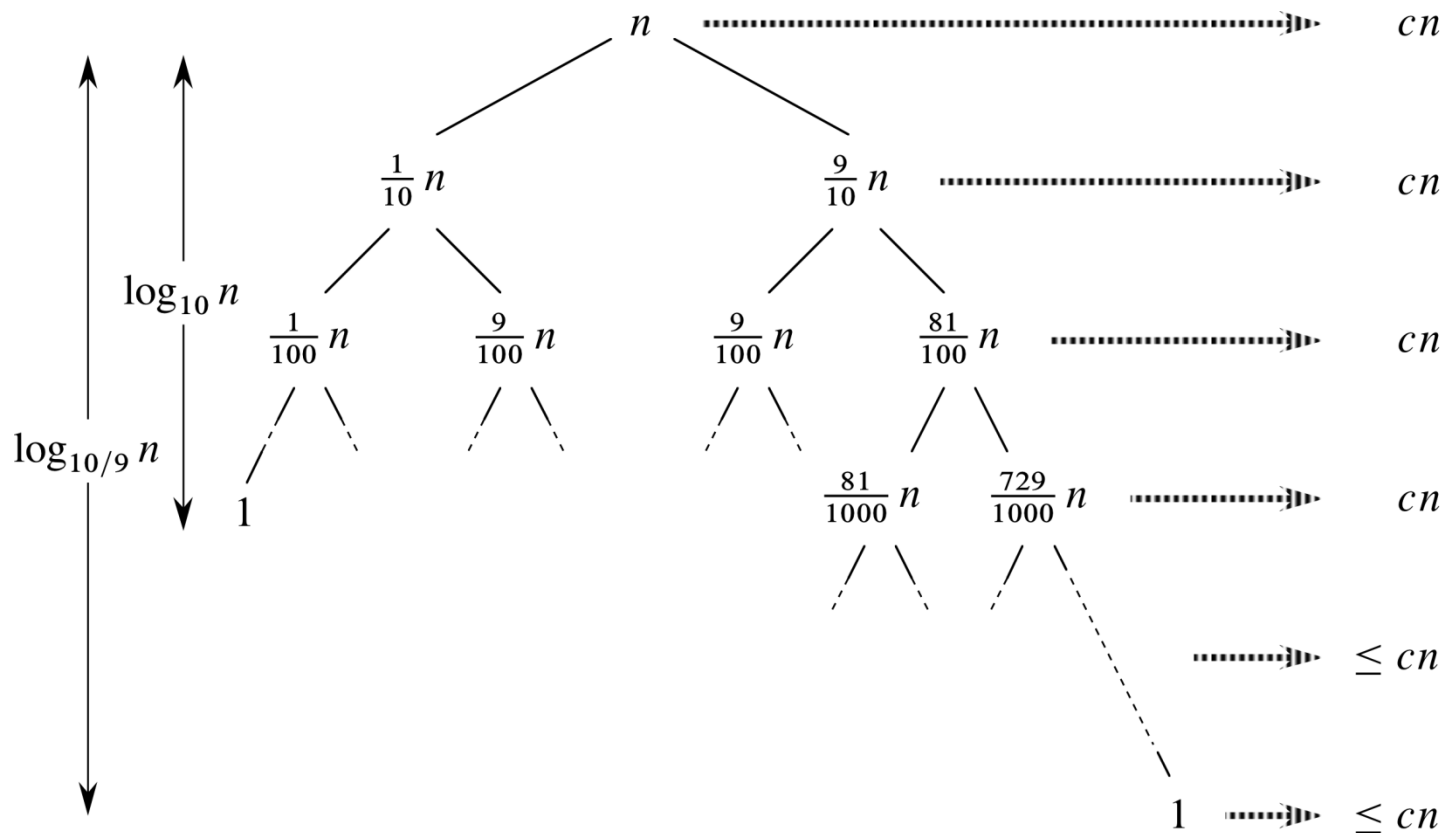
- $T(n) = T(9n/10) + T(n/10) + cn$

Time needed for the "1/10 subsequence"

- $= \left(T\left(\frac{81n}{100}\right) + T\left(\frac{9n}{100}\right) + \frac{9cn}{10} \right) + \left(T\left(\frac{9n}{100}\right) + T\left(\frac{1n}{100}\right) + \frac{cn}{10} \right) + cn$

- $= \dots$

Average running time



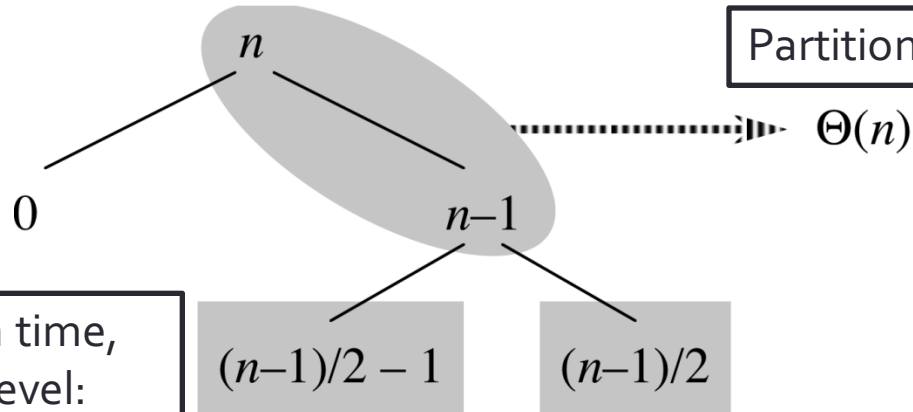
As long as the pivot can partition according to a particular ratio (even not close to 50%), we can still obtain $O(n \lg n)$ running time!

$O(n \lg n)$

Average running time

Case 1:
Worst case for
the first level
partition,
but best-case
for second
level.

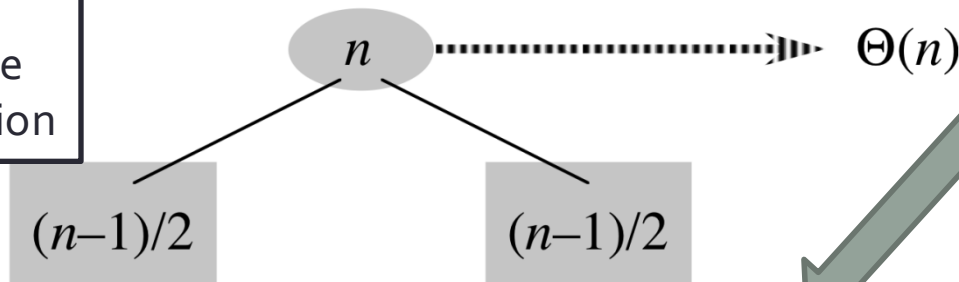
Partition time,
second level:
 $\Theta(n - 1)$



Partition time for the first level: $\Theta(n)$

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

Case 2:
Best case for the
first level partition



Partition time for the first level: $\Theta(n)$

Same!
(Case 1 has larger
constant)
The better-partitioned
level would "absorb"
the extra running time for
worse-partitioned level.

比較四大金剛

	Worst	Average	Additional Space?
Insertion sort	$O(n^2)$	$O(n^2)$	$O(1)$
Merge sort	$O(n \log n)$	$O(n \log n)$	$O(n)$
Quick sort	$O(n^2)$	$O(n \log n)$	$O(1)$
Heap sort	$O(n \log n)$	—	$O(1)$

Not covered today!

- Insertion sort: quick with small input size n . (small constant)
- Quick sort: Best average performance (fairly small constant)
- Merge sort: Best worst-case performance
- Heap sort: Good worst-case performance, no additional space needed.
- Real-world strategy: **a hybrid of insertion sort** + others. Use **input size n** to determine the algorithm to use.