Analysis of Sorting Algorithms

Lec 2, CMSC 142

Sorting

- **Input:** array of items, **Output**: sorted array
- Given an array of items, arrange them according to a specified order
- **Out-of-place sorting** - uses extra data structure / memory in sorting
- **In-place sorting** - sorting on the input array itself, using swaps; no extra memory needed

Note:

- The pseudocodes are 1-indexed (array index starts at 1, not 0).
- Let N = length of array.
- Memory in analysis → extra memory (e.g. array, data structure) needed by algorithm;

Insertion Sort

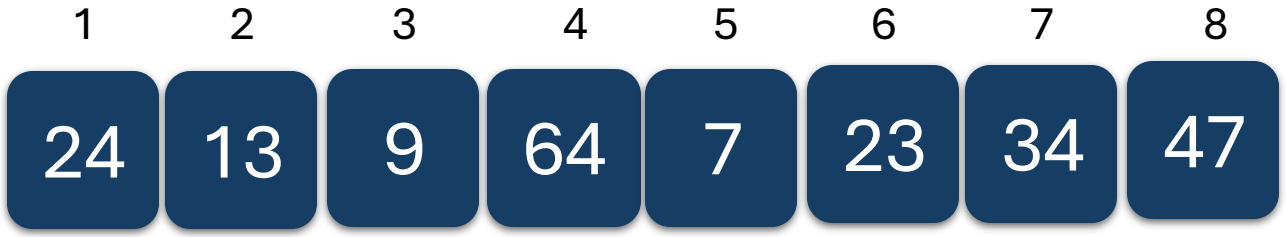
Insertion Sort

- **In-place** sorting algorithm that inserts items into their rightful positions
- **Analogy:** Similar to sorting a hand of playing cards - remove one card at a time from the table and insert it into correct position by comparing it with each of the cards already in hand
- **Idea:** assume that the items to the left of current item are already sorted; add the current item to the sorted items by looking for the right position to insert it in
- Efficient for sorting small number of elements and when array is already nearly sorted

Insertion Sort

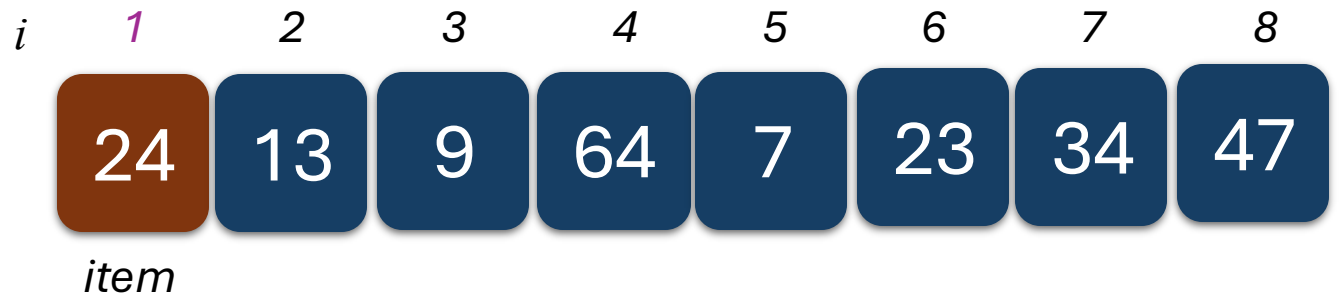
```
insertion_sort(array A):
    for i = 1 to N:
        sorted_items = items before A[i]
        shift items higher than A[i] in sorted_items one place to the right
        insert A[i] into its correct position in sorted_items
```

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



i=0

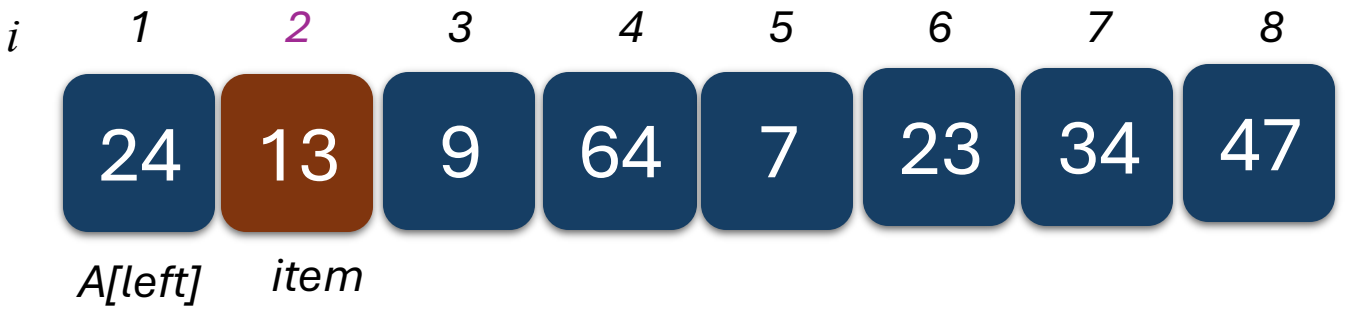
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                  24
        left = i – 1                 0
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item               A[1]=24
```



$24 > 13$

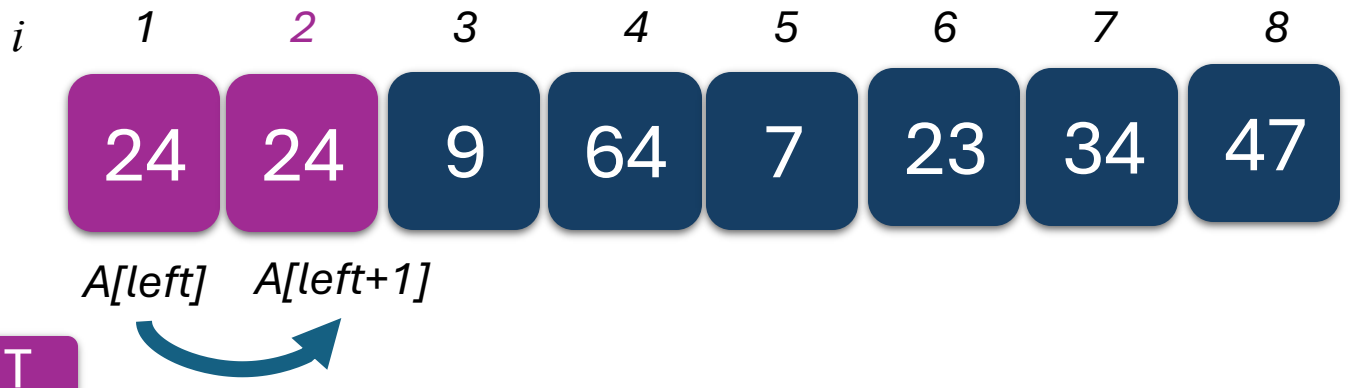
i=2

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left]
            left = left – 1
    A[left + 1] = item
```



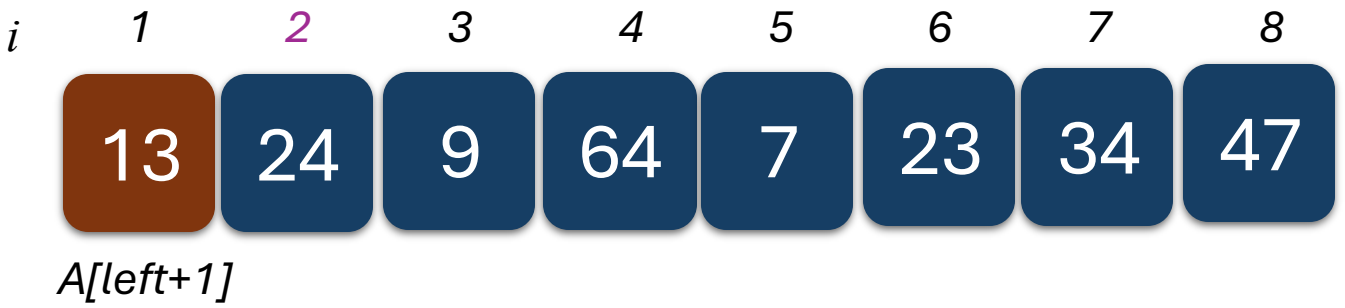
$24 > 13$

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left]              A[2] = A[1]
            left = left – 1
    A[left + 1] = item
```



Put 13 back!

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    13
        left = i – 1
        while left > 0 and A[left ] > item :    F
            A[left + 1] = A[left]
            left = left – 1            0
    A[left + 1] = item                 A[1] = 13
```



$24 > 9$

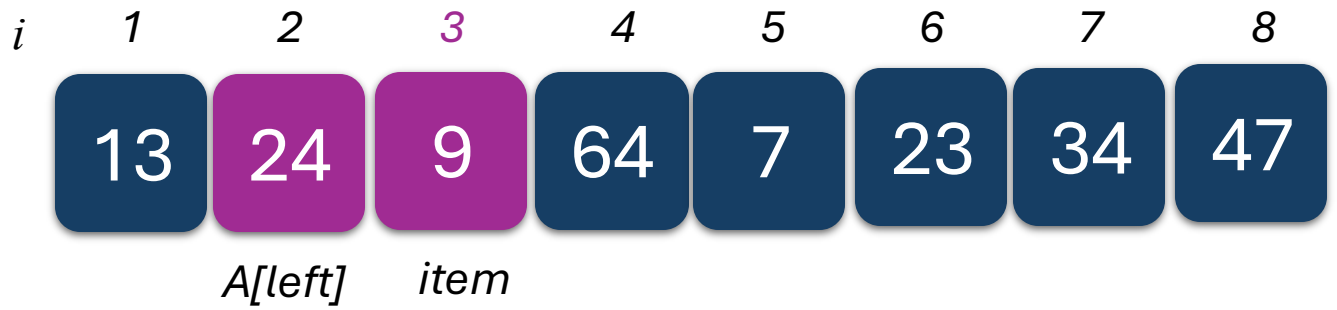
i=3

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          9
        left = i – 1         2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

$24 > 9$

i=3

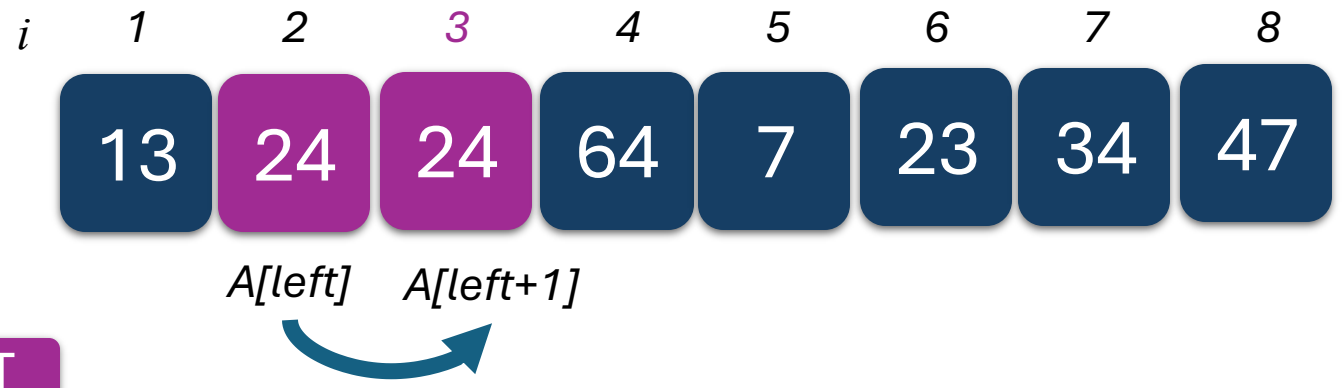
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          9
        left = i – 1         2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



$24 > 9$

i=3

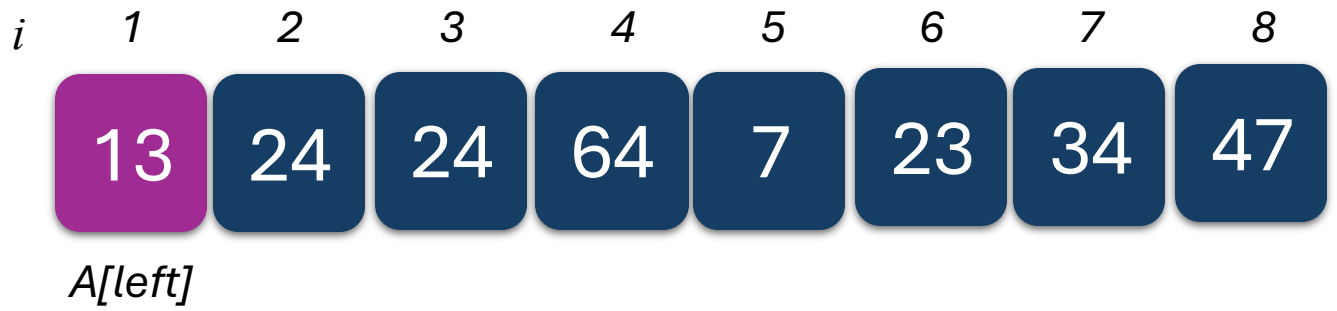
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          9
        left = i – 1                         2
        while left > 0 and A[left ] > item :  T
            A[left + 1] = A[left ]           A[3] = A[2]
            left = left – 1
    A[left + 1] = item
```



$13 > 9$

i=3

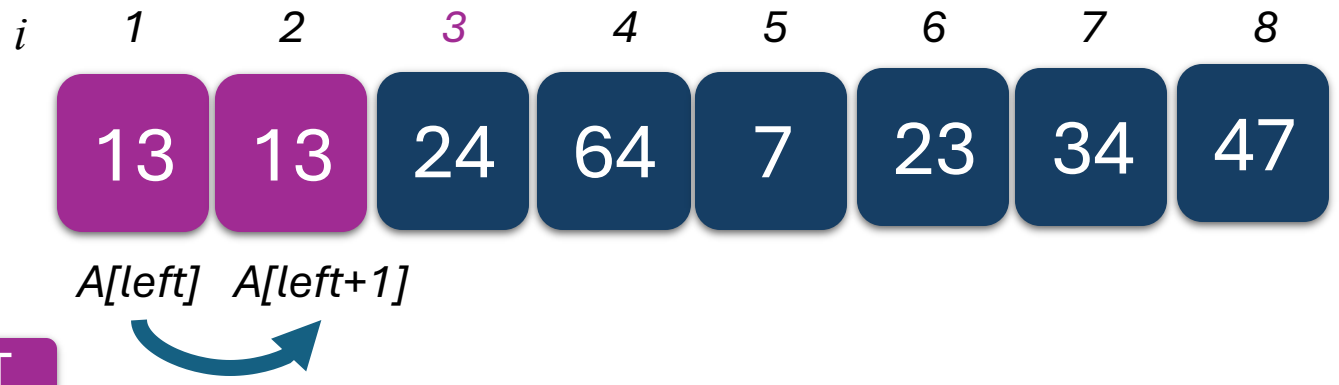
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          9
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1                    1
    A[left + 1] = item
```



$13 > 9$

i=3

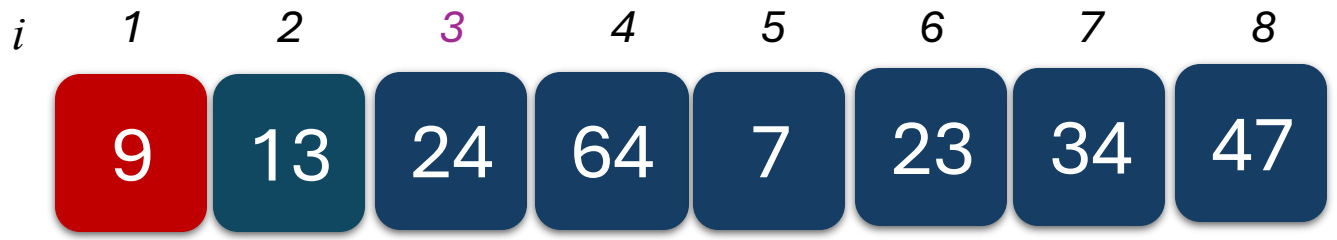
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          9
        left = i – 1
        while left > 0 and A[left ] > item :  T
            A[left + 1] = A[left ]           A[2] = A[1]
            left = left – 1
    A[left + 1] = item
```



Insert 9

i=3

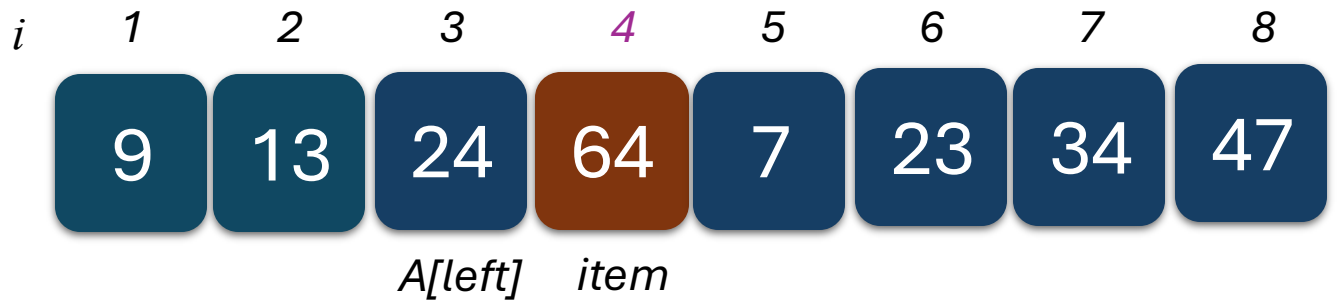
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                  9
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1          0
    A[left + 1] = item               A[1] = 9
```



$24 < 64$

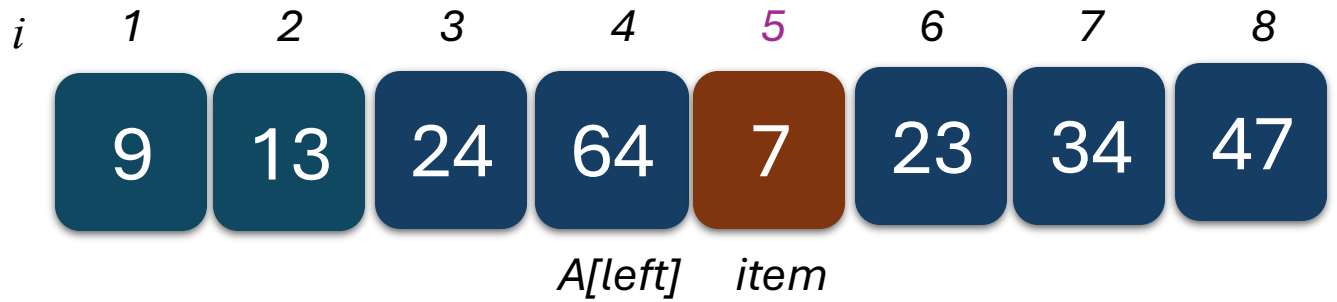
i=4

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                  64
        left = i – 1                 3
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item               A[4] = 64
```



i=5

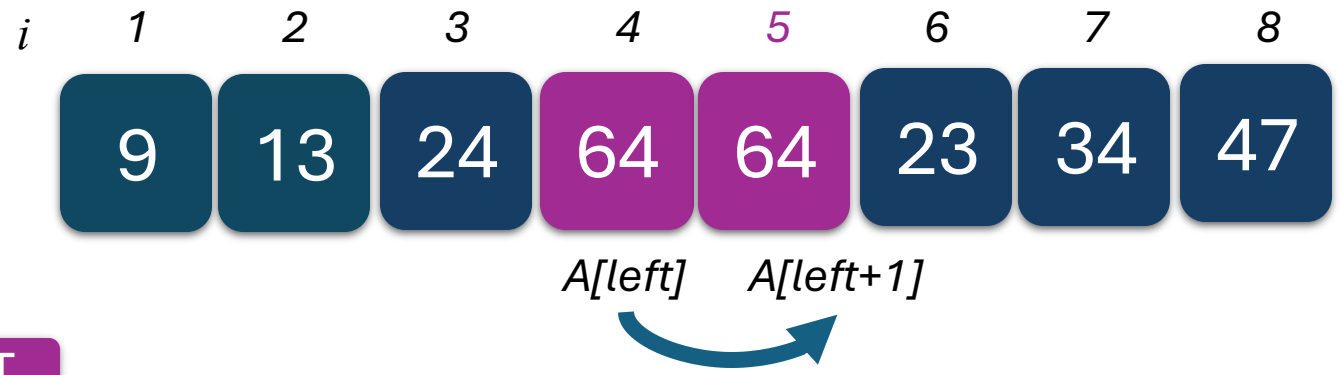
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1         4
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



64>7

i=5

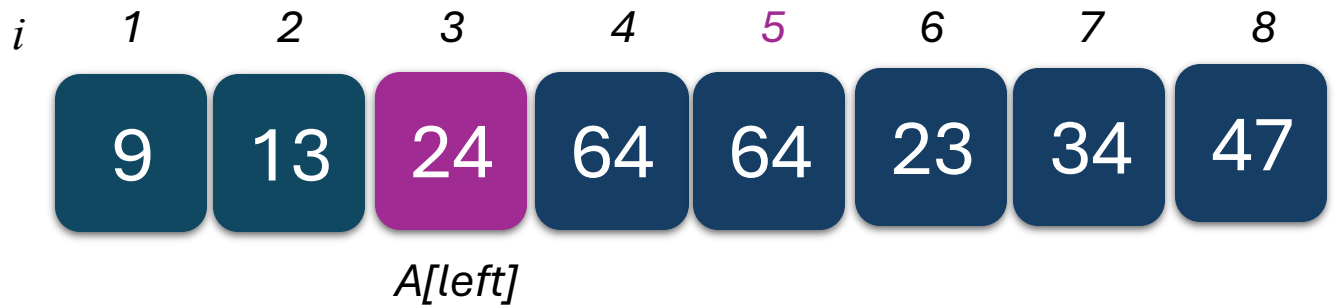
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1         4
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]             A[5] = A[4]
            left = left – 1
    A[left + 1] = item
```



$24 > 7$

i=5

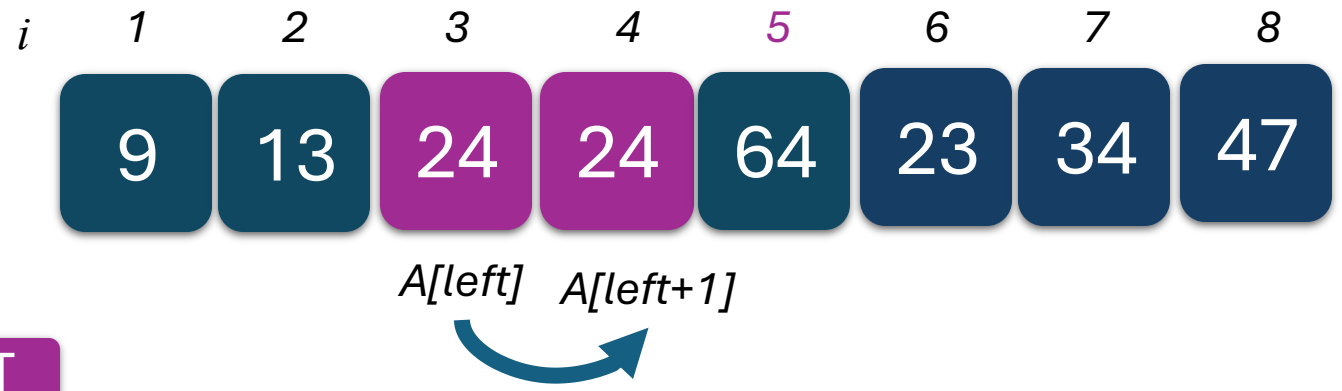
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1      3
    A[left + 1] = item
```



24>7

i=5

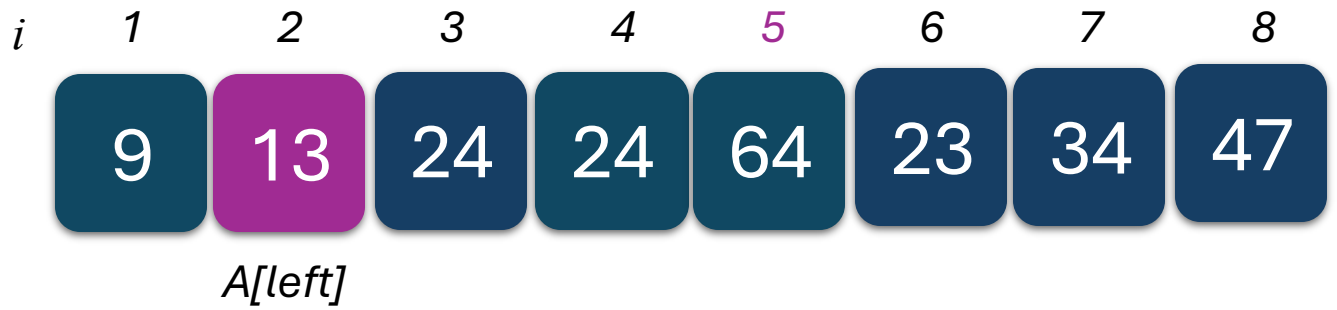
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :    T
            A[left + 1] = A[left ]              A[4] = A[3]
            left = left – 1
    A[left + 1] = item
```



$13 > 7$

$i=5$

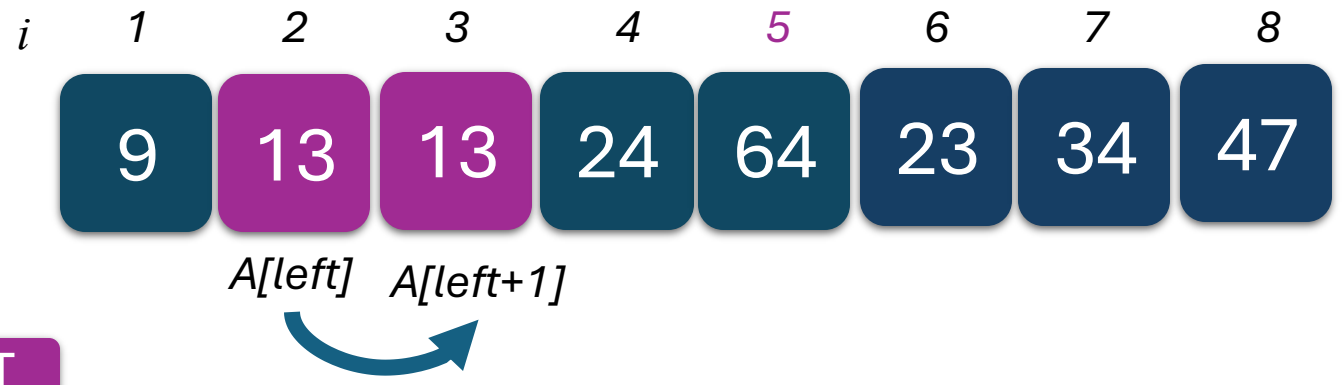
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1      2
    A[left + 1] = item
```



$13 > 7$

$i=5$

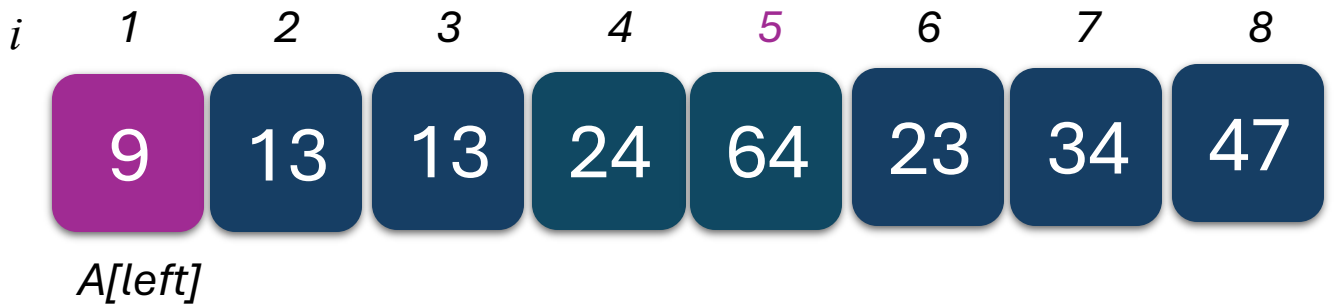
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          7
        left = i – 1
        while left > 0 and A[left ] > item :  T
            A[left + 1] = A[left ]           A[3] = A[2]
            left = left – 1
    A[left + 1] = item
```



$9 > 7$

i=5

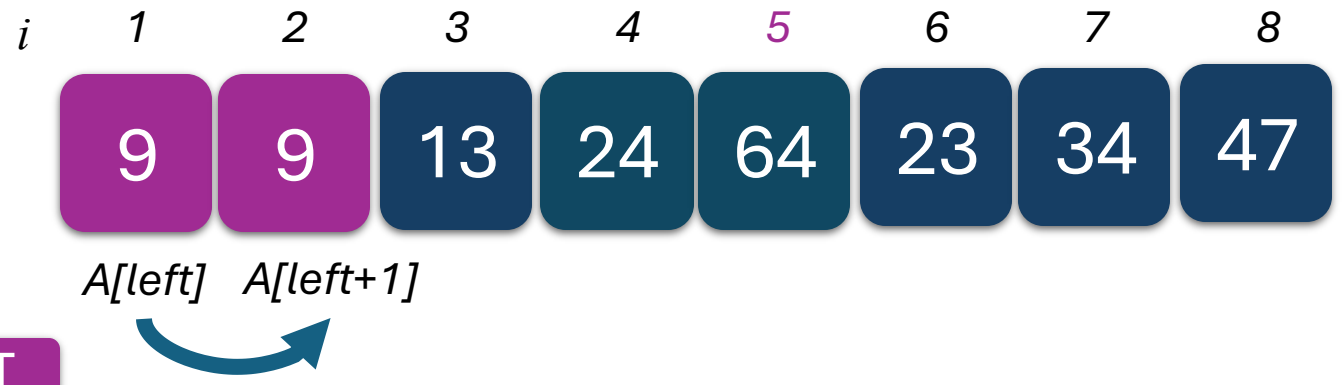
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :    T
            A[left + 1] = A[left ]
            left = left – 1          1
    A[left + 1] = item
```



$9 > 7$

i=5

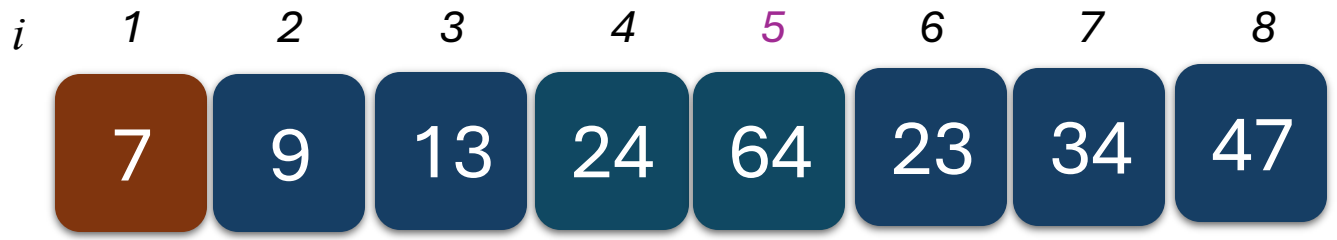
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Insert 7

i=5

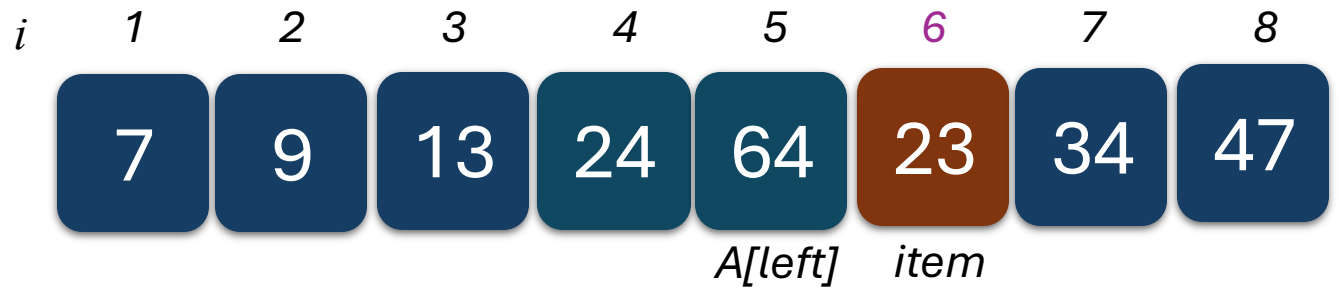
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    7
        left = i – 1
        while left > 0 and A[left ] > item :    F
            A[left + 1] = A[left ]
            left = left – 1            0
    A[left + 1] = item                 A[1] =7
```



Item 23

i=6

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1         5
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



64>23

i=6

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]   A[6] =A[5]
            left = left – 1
    A[left + 1] = item
```

$24 > 23$

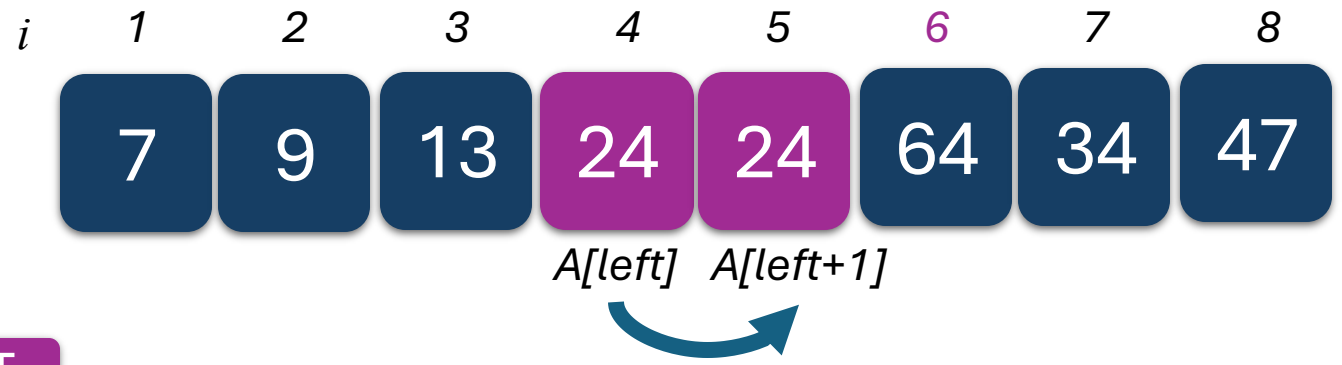
$i=6$

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    23
        left = i – 1
        while left > 0 and A[left ] > item :    T
            A[left + 1] = A[left ]
            left = left – 1            4
    A[left + 1] = item
```

$24 > 23$

$i=6$

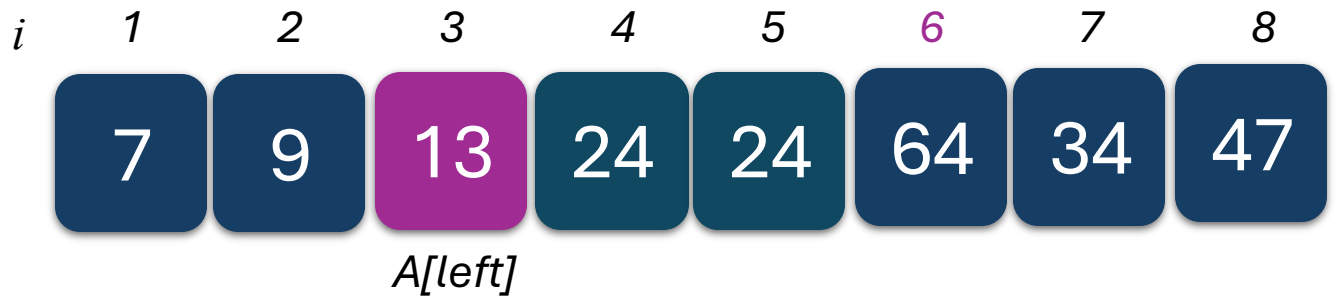
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]             A[5] =A[4]
            left = left – 1
    A[left + 1] = item
```



$13<23$

i=6

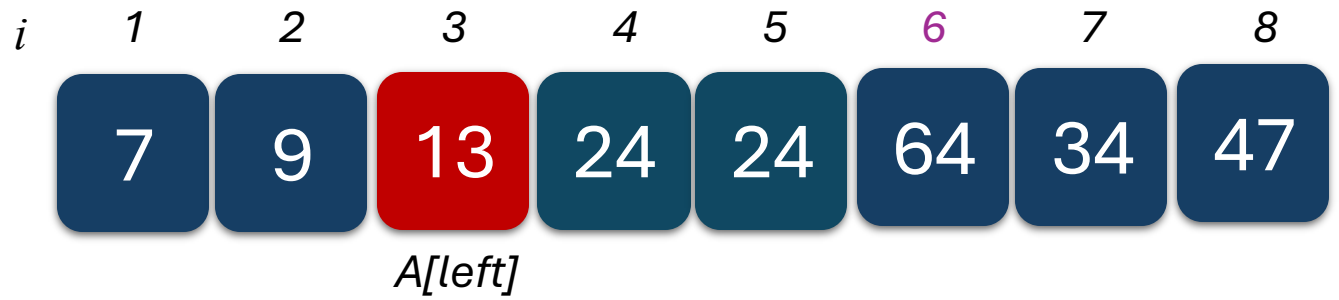
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1      3
    A[left + 1] = item
```



13<23

i=6

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1      3
    A[left + 1] = item
```



Insert 23

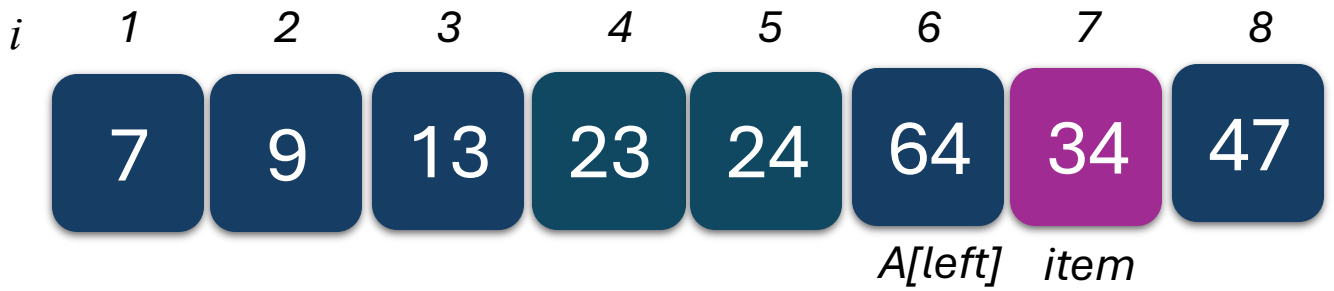
i=6

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    23
        left = i – 1
        while left > 0 and A[left ] > item :    F
            A[left + 1] = A[left ]
            left = left – 1            3
    A[left + 1] = item                 A[4] =23
```

Item 34

i=7

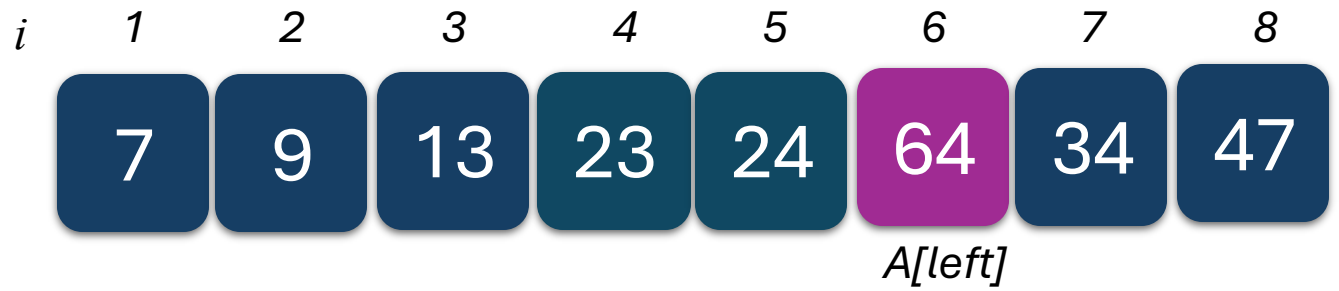
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          34
        left = i – 1         6
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



64>34

i=7

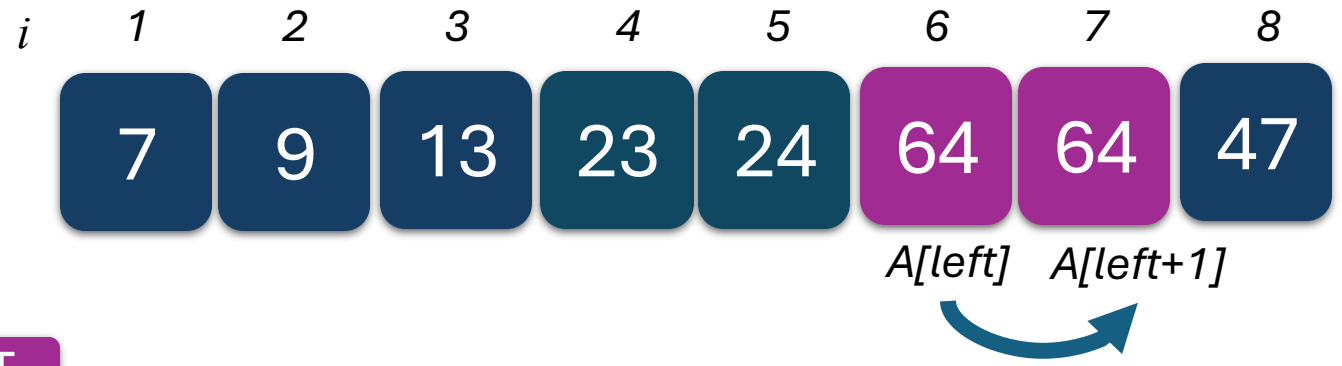
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          34
        left = i – 1                         6
        while left > 0 and A[left ] > item :  T
            A[left + 1] = A[left ]           A[6] =A[5]
            left = left – 1
    A[left + 1] = item
```



64>34

i=7

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          34
        left = i – 1         6
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]             A[6] =A[5]
            left = left – 1
    A[left + 1] = item
```



24<34

i=7

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          34
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1      5
    A[left + 1] = item
```

$24<34$

$i=7$

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          34
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1   5
    A[left + 1] = item
```

Insert 34

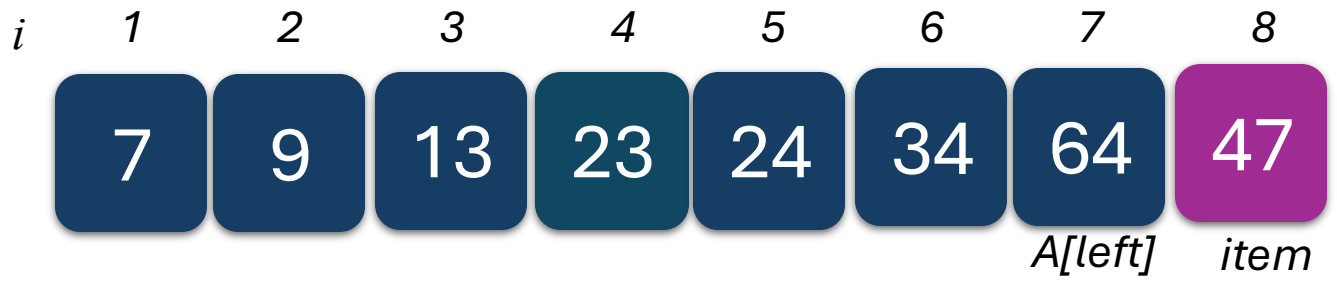
i=7

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          34
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]
            left = left – 1      5
    A[left + 1] = item       A[6] =34
```

Item 47

i=8

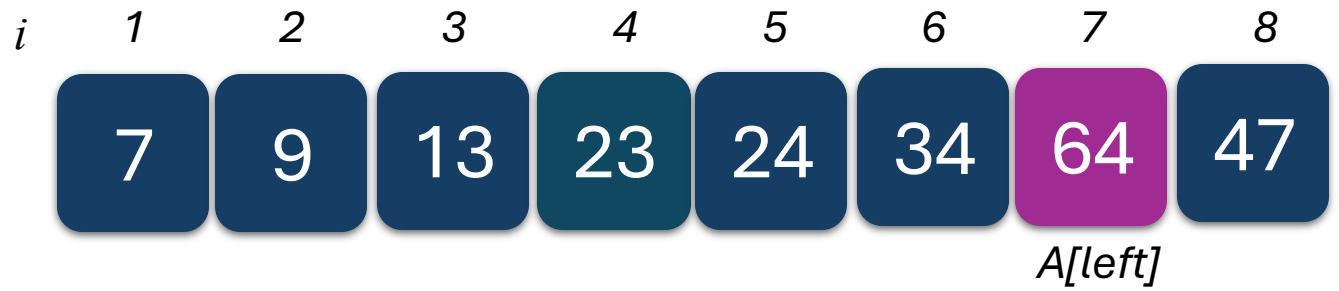
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          47
        left = i – 1         7
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



64>47

i=8

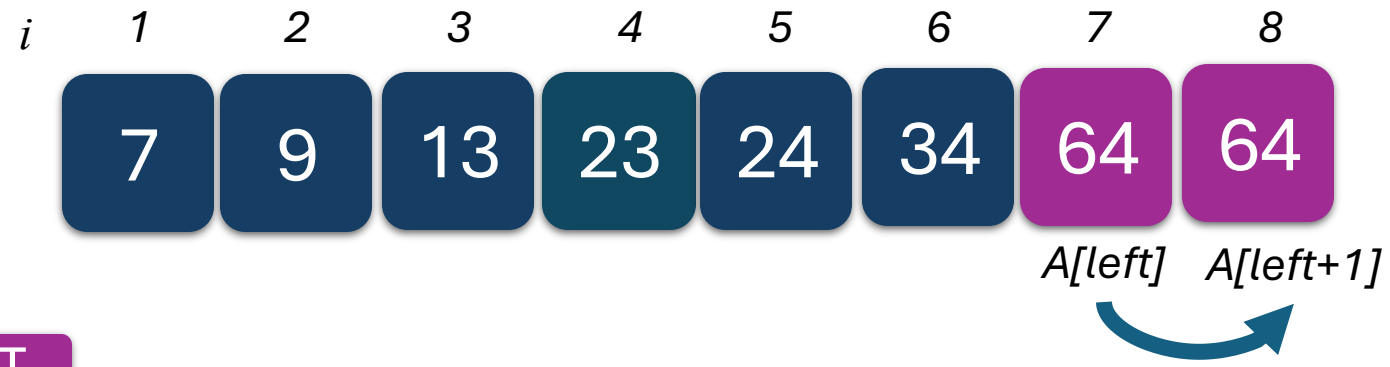
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          47
        left = i – 1         7
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



64>47

i=8

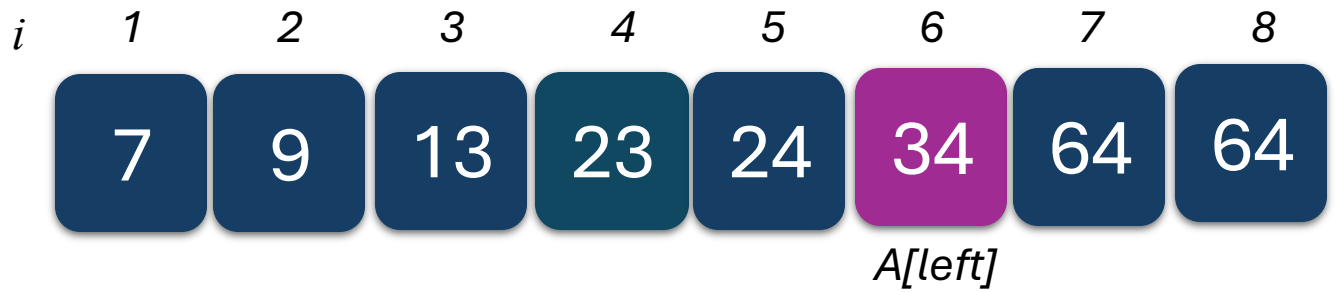
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          47
        left = i – 1         7
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



$34<47$

i=8

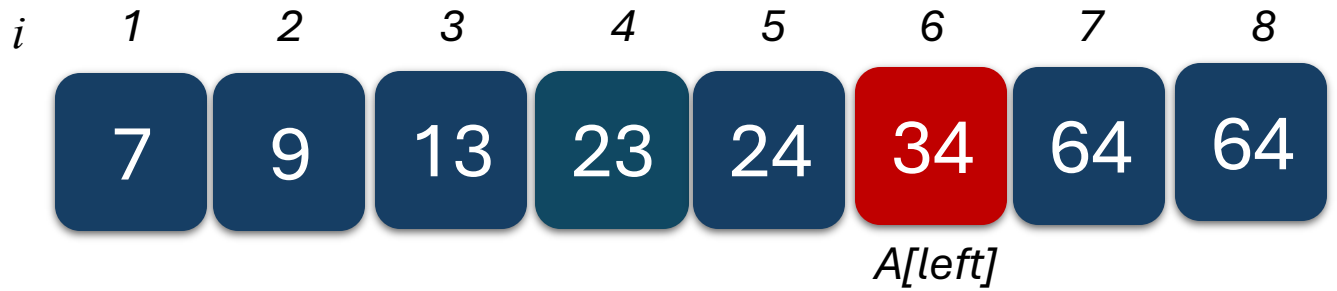
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          47
        left = i – 1
        while left > 0 and A[left ] > item :    F
            A[left + 1] = A[left ]
            left = left – 1      6
    A[left + 1] = item
```



$34<47$

i=8

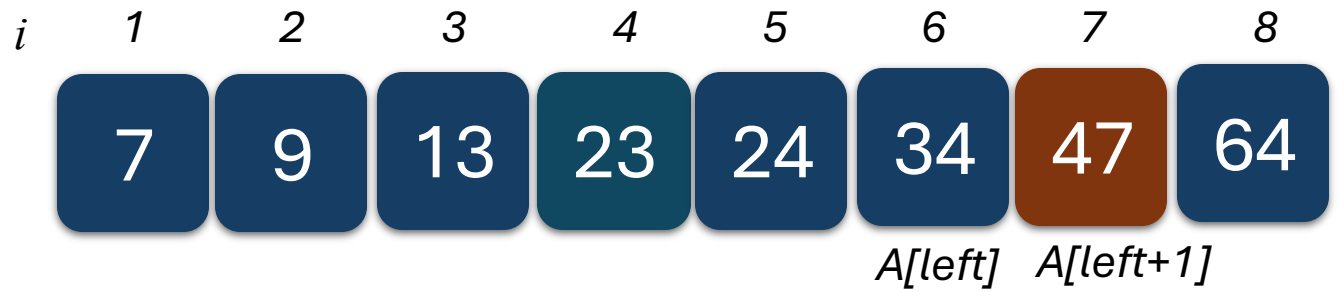
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          47
        left = i – 1
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1      6
    A[left + 1] = item
```



Insert 47

i=8

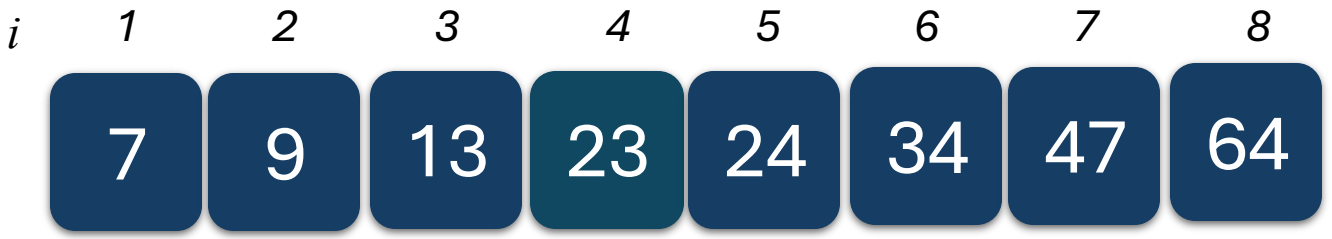
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    47
        left = i – 1
        while left > 0 and A[left ] > item :    F
            A[left + 1] = A[left ]
            left = left – 1            6
    A[left + 1] = item                 A[6]=47
```



i=9

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

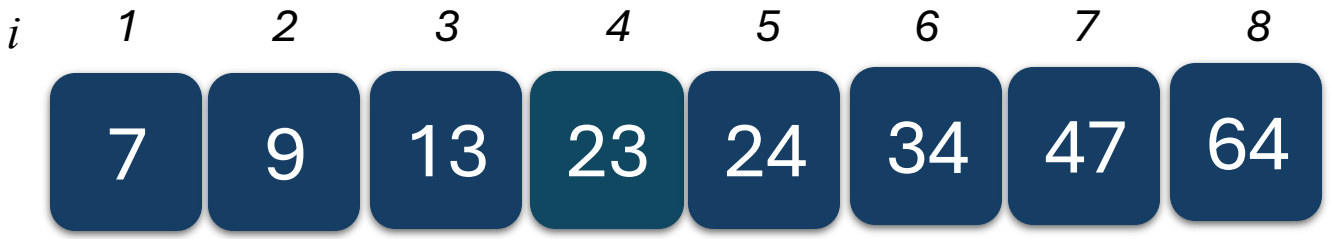
F



i=9

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

F



Insertion Sort Complexity

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          C1   n
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]           C2   n
            left = left – 1
    A[left + 1] = item                       C3   n
```

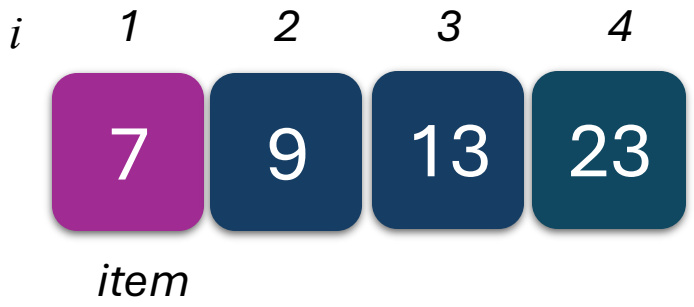
Best Case?

If the array is already sorted
while-loop runs for 1 iteration,
no inserts / shifts will happen

$T(n) = (c_1 + +c_2+c_3)(n)$
$= an$
$= O(n)$

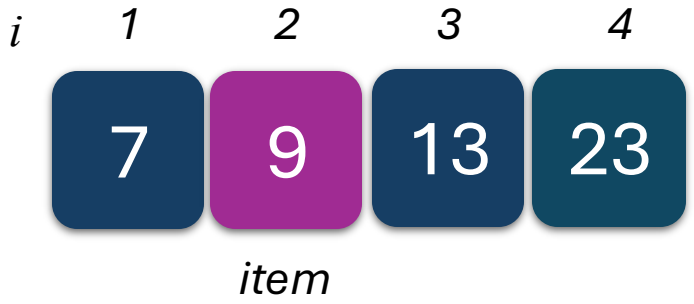
i=1

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1         0
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



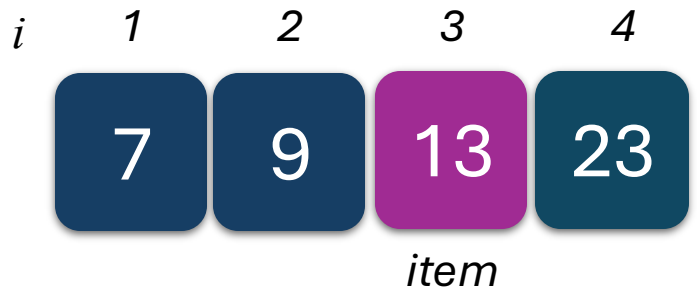
i=2

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          9
        left = i – 1         0
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



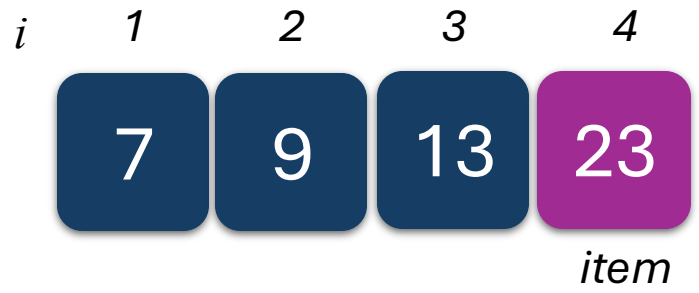
i=3

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         2
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



i=4

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         3
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



And so on and so forth....

Insertion Sort Complexity

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                                  } C1   n
        left = i – 1
        while left > 0 and A[left ] > item :         }
            A[left + 1] = A[left ]                   }  1+2+3…+n
            left = left – 1                          }
    A[left + 1] = item                               } C3   n
```

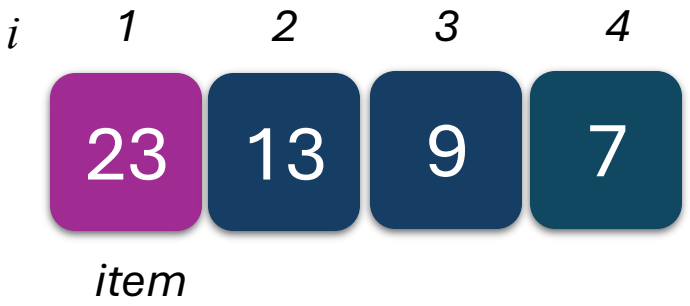
Worst Case?

If the array is reverse-sorted while-loop runs for i-1 iterations (dependent on iteration no.), because item has to be inserted all the way in front of the i-1 previous items

$$T(n) = (c_1 + c_3)(n-1) + \{1+2+3+\ldots+(n-1)\}\, c_2$$
$$= (c_1 + c_3)(n-1) + n(n-1)/2 * c_2$$
$$= an^2 + bn + c$$
$$= O(n^2)$$

i=1

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          23
        left = i – 1         0
        while left > 0 and A[left ] > item :   F
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

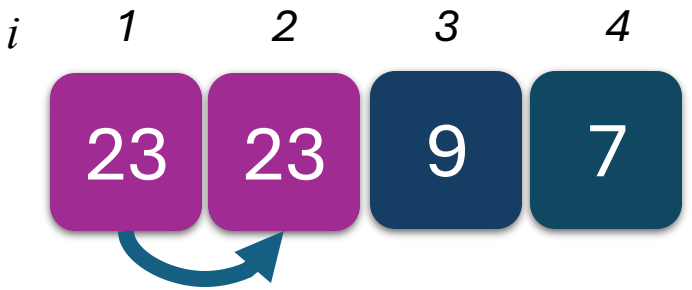


i=2

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

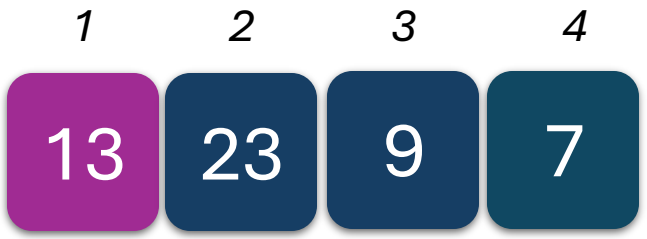
i=2

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          13
        left = i – 1         1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



i=2

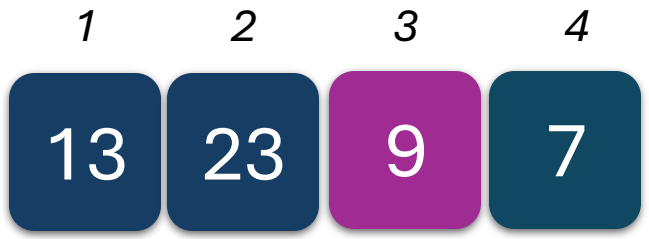
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    13
        left = i – 1                   1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1

i=3

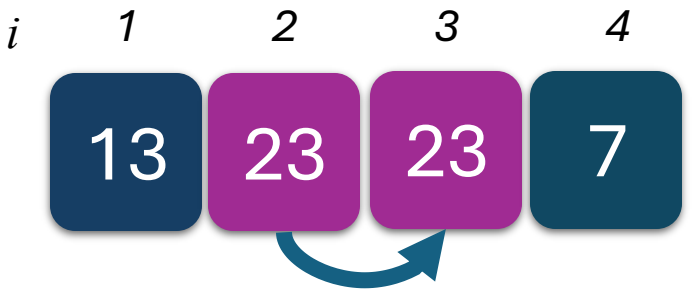
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    9
        left = i – 1                   2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +()

i=3

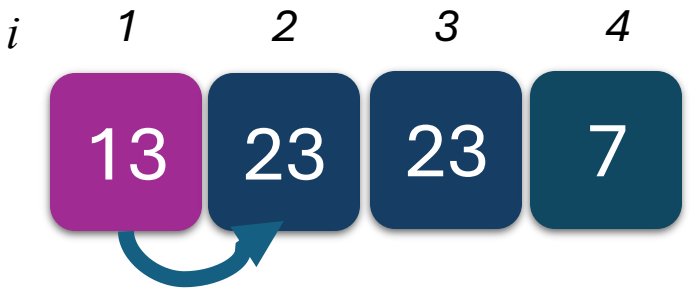
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    9
        left = i – 1                   2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1)

i=3

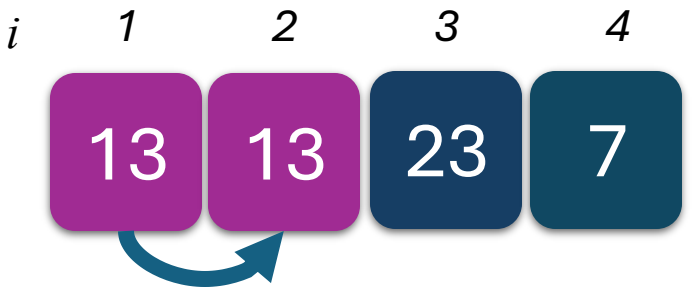
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    9
        left = i – 1                   2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1)

i=3

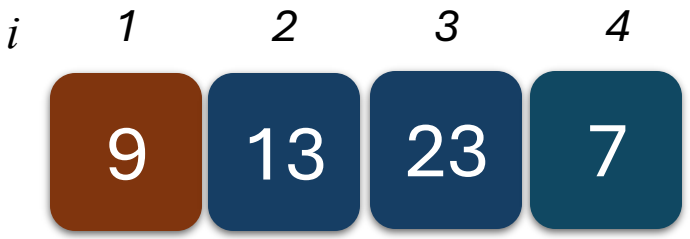
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    9
        left = i – 1                   2
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)

i=3

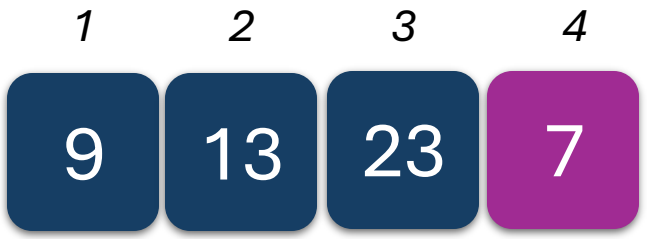
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                          9
        left = i – 1                         2
        while left > 0 and A[left ] > item :  T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)

i=4

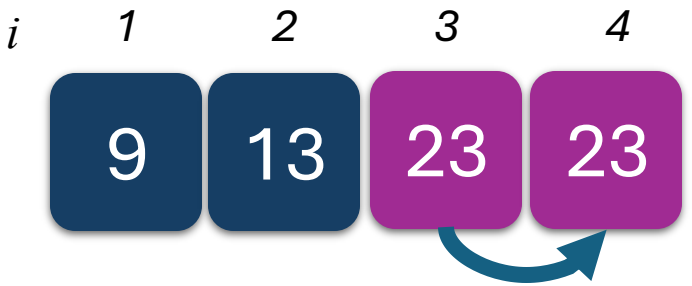
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1         3
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)+

i=4

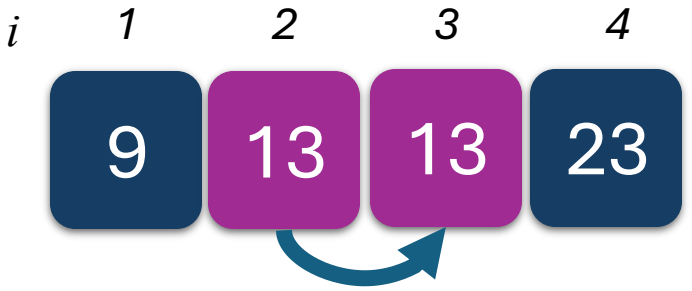
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]                    7
        left = i – 1                   3
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)+(1)

i=4

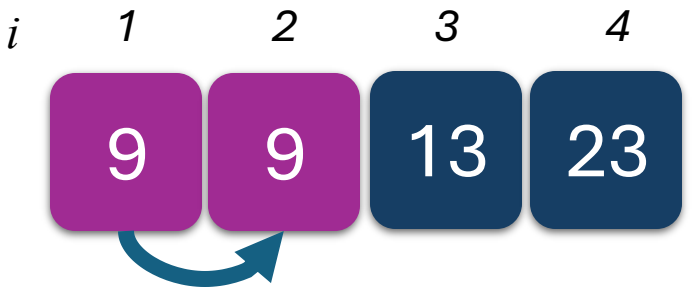
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)+(1+1)

i=4

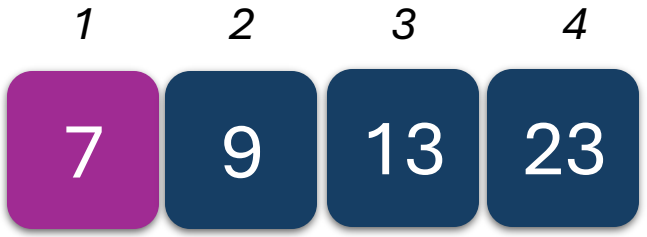
```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)+(1+1+1)

i=4

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]          7
        left = i – 1
        while left > 0 and A[left ] > item :   T
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```



Number of iterations:
1 +(1+1)+(1+1+1) = 1+2+3

Having n items….
Number of iterations:
1 +(1+1)+(1+1+1)+…+n = 1+2+3+…+n

Insertion Sort Complexity

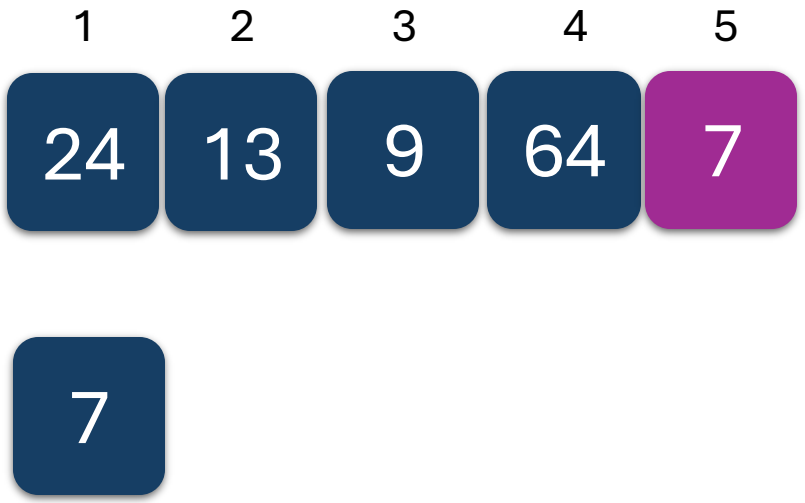
- Memory: O(1) → no extra memory needed

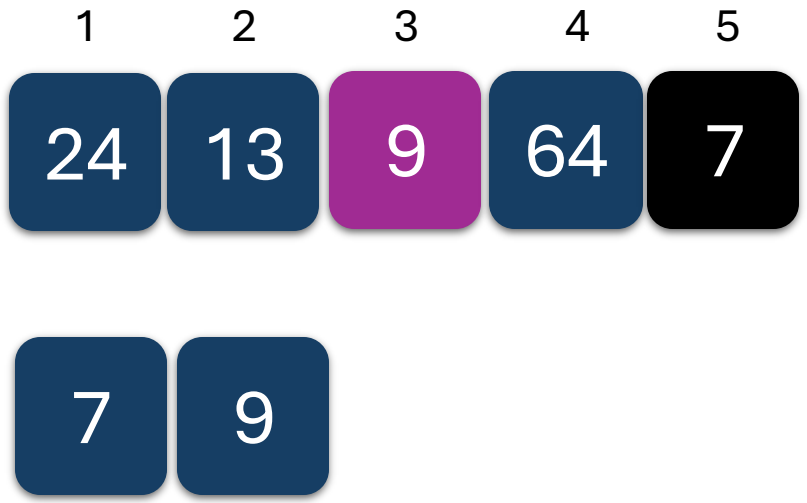
Selection Sort

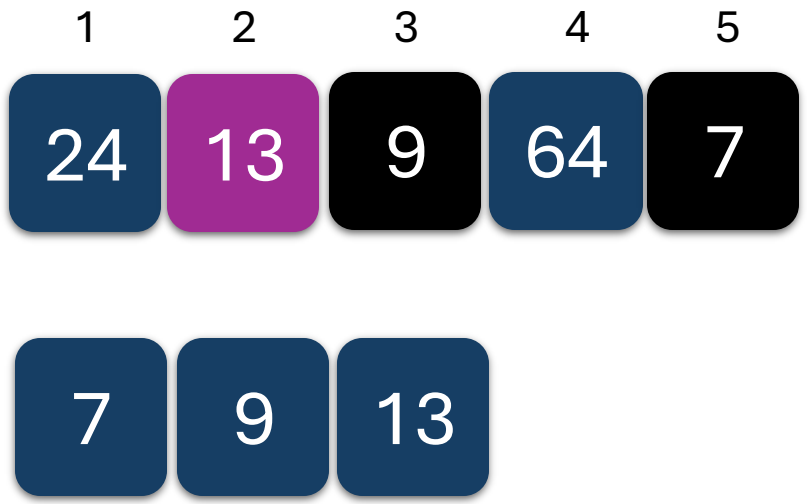
Selection Sort

- A naive sorting algorithm; one of the slowest sorting algorithms since it repeatedly performs same task without learning from previous iterations
- **Analogy**: Given a pile of cards, a common way to sort it is to select and remove the smallest card, and repeat the process until all cards are gone
- **Idea**: Find 1st smallest element and exchange it with element in 1st position; find 2nd smallest element and exchange it with element in 2nd position, and so on.
- Minimizes number of swaps; useful for applications where cost of swapping in memory is high

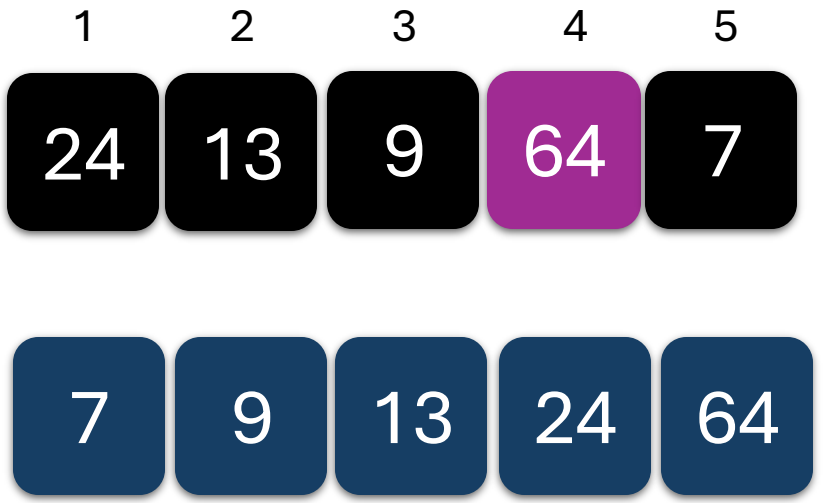

1
2
3
4
5
24
13
9
64
7


1
2
3
4
5
24
13
9
64
7
7


1
2
3
4
5
24
13
9
64
7
7
9


1
2
3
4
5
24
13
9
64
7
7
9
13


1
2
3
4
5
24
13
9
64
7
7
9
13
24


1
2
3
4
5
24
13
9
64
7
7
9
13
24
64

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

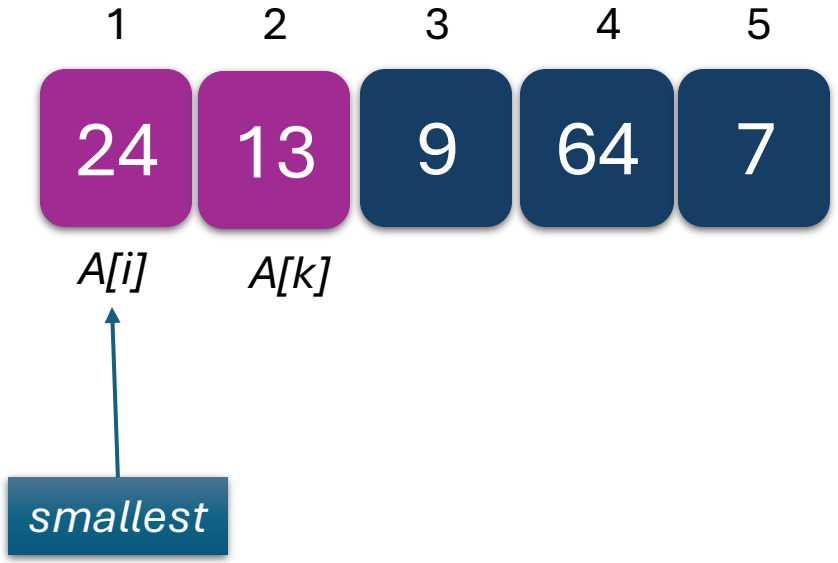
i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

24

k=2

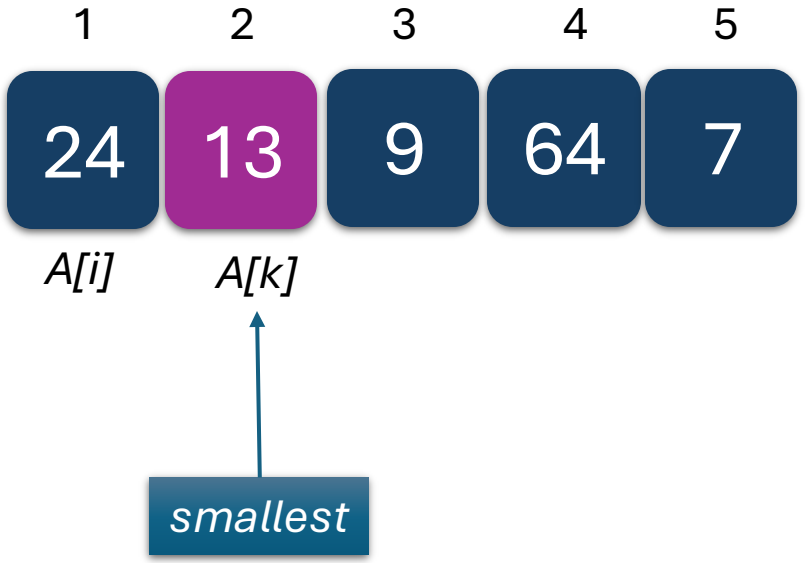
T



Total Number of iteration (inner loop):
For i = 1
1

i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]          24
    for k = i + 1 to N:          k=2
        if A[k] < ith_smallest :  T
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



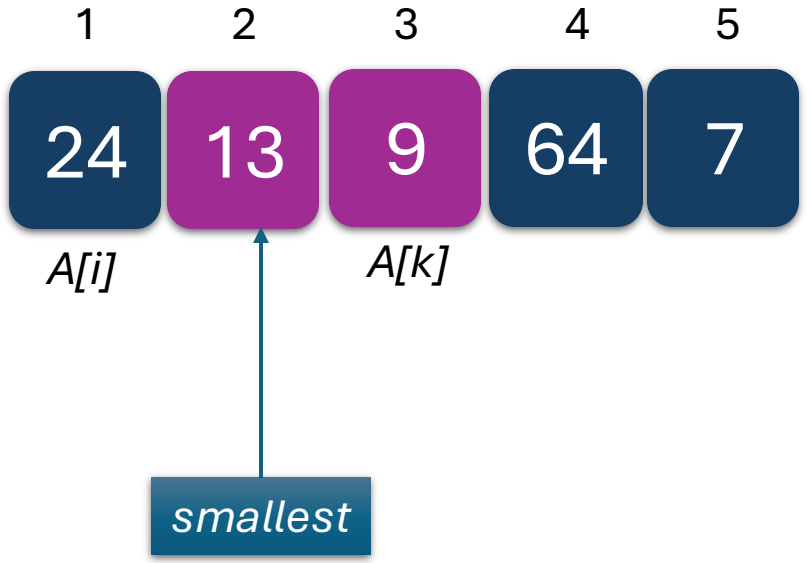
Total Number of iteration (inner loop):
For i = 1
1

i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

24

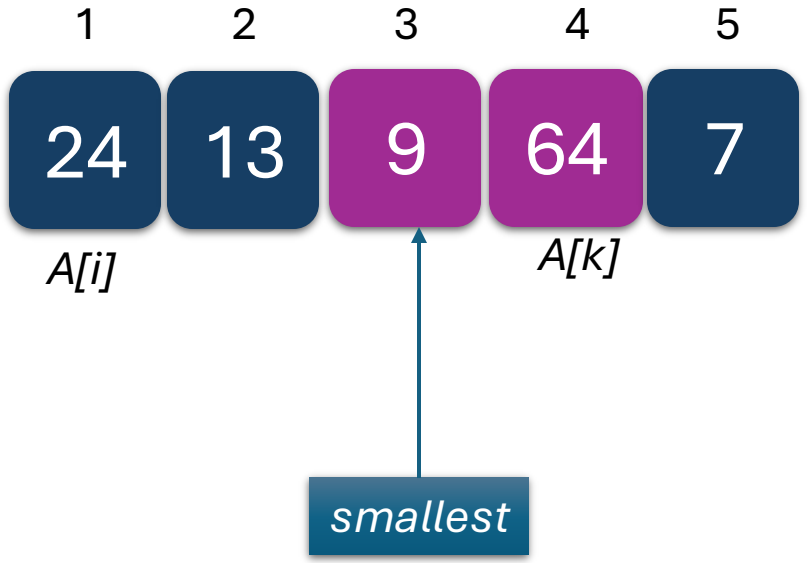
k=3



Total Number of iteration (inner loop):
For i = 1
1+1

i=1

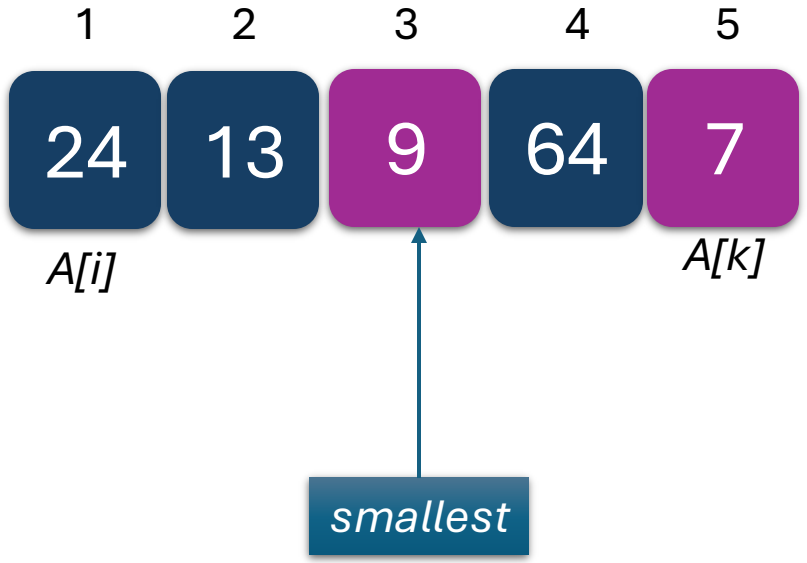
```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]          24
    for k = i + 1 to N:          k=4
        if A[k] < ith_smallest :  F
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 1
1+1+1

i=1

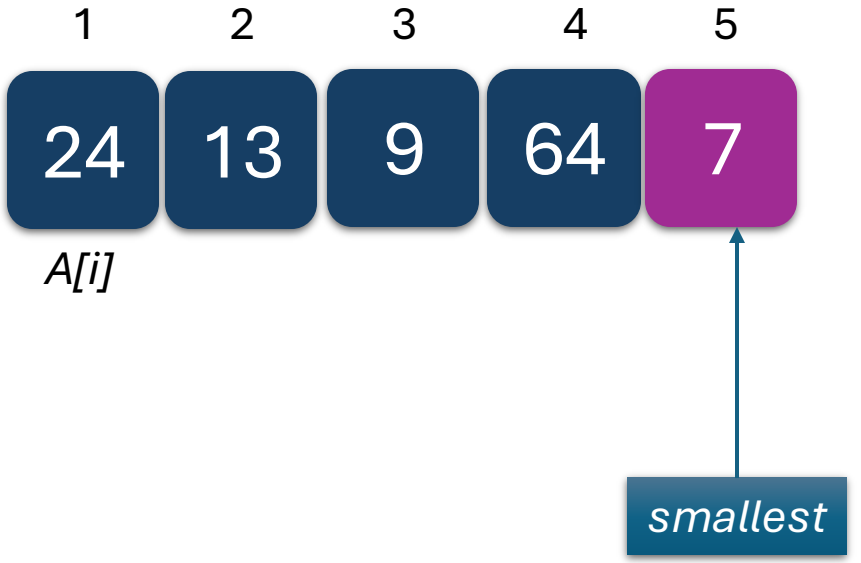
```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]          24
    for k = i + 1 to N:          k=5
        if A[k] < ith_smallest :  T
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 1
1+1+1+1 = 4

i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]          24
    for k = i + 1 to N:          k=5
        if A[k] < ith_smallest :  T
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



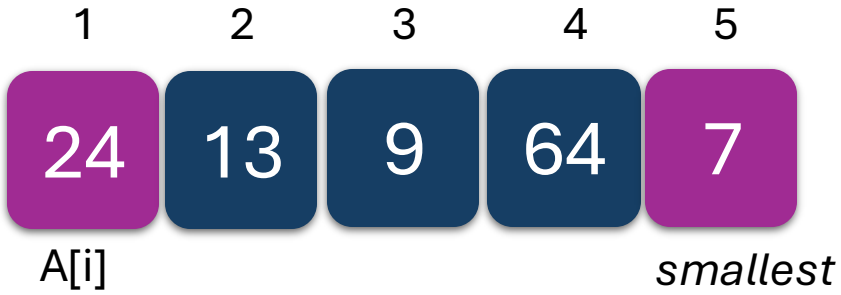
i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

24

k=5

A[1] ↔ A[5]



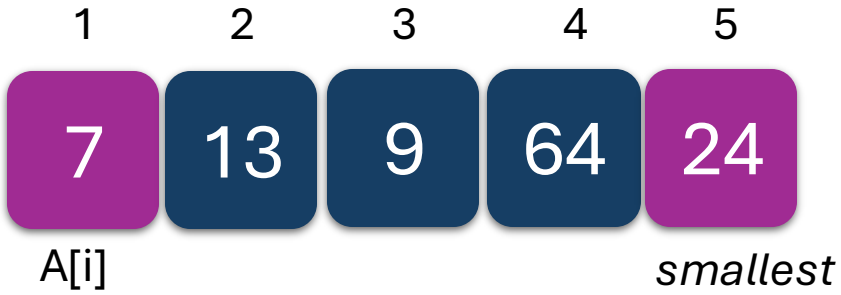
i=1

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

24

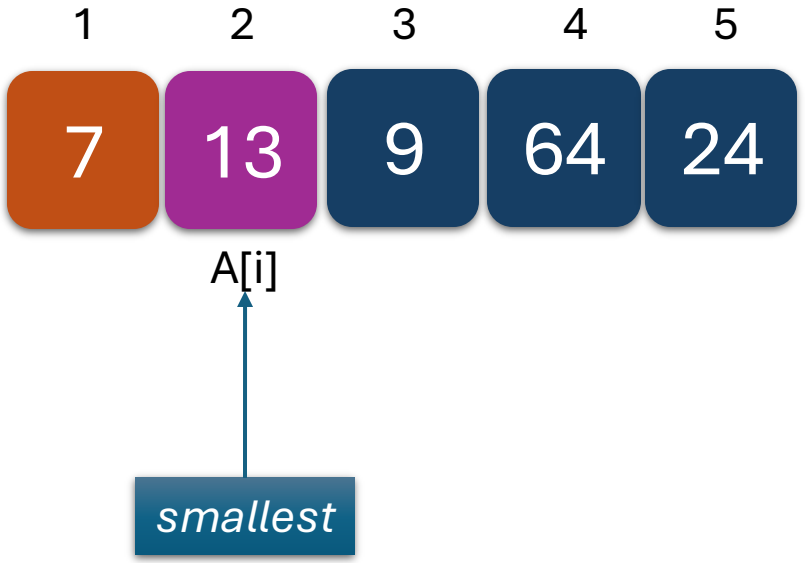
k=5

A[1] ↔ A[5]



i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]        13
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 2
4+ ()

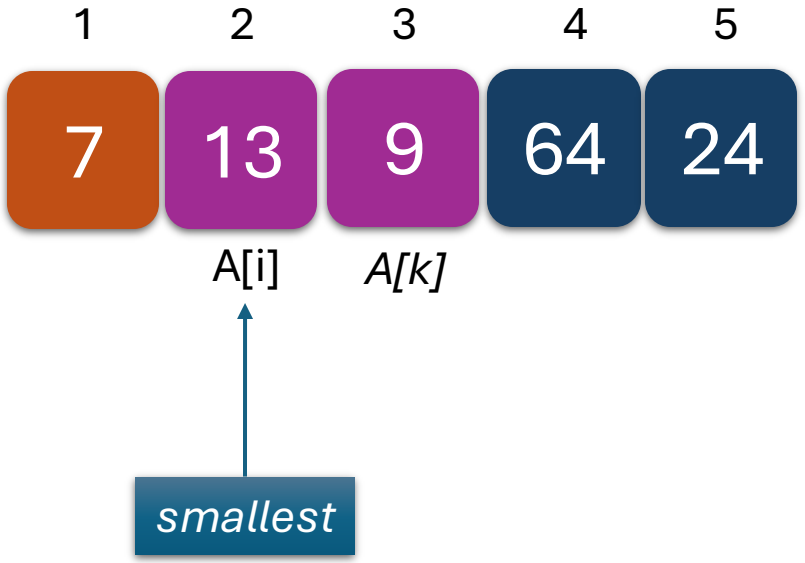
i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

13

k=3

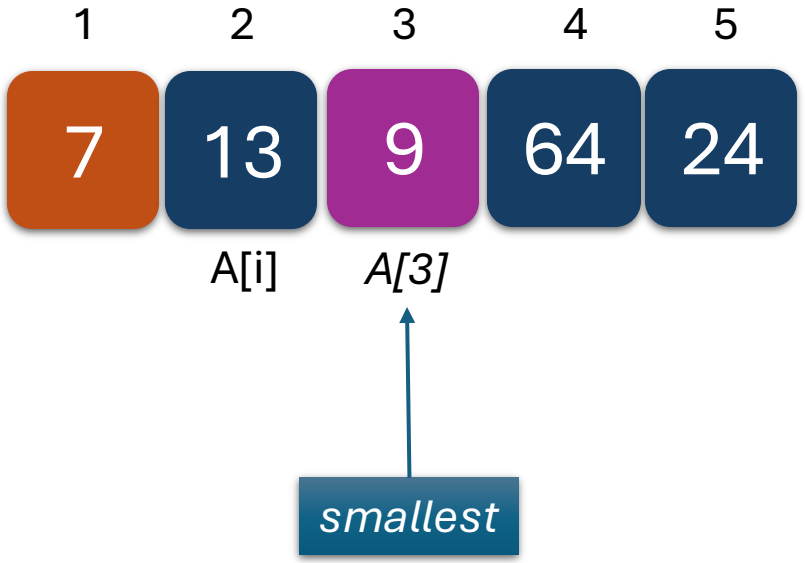
T



Total Number of iteration (inner loop):
For i = 2
4+ (1)

i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :      T
            ith_smallest = A[k]       9
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 2
4+ (1)

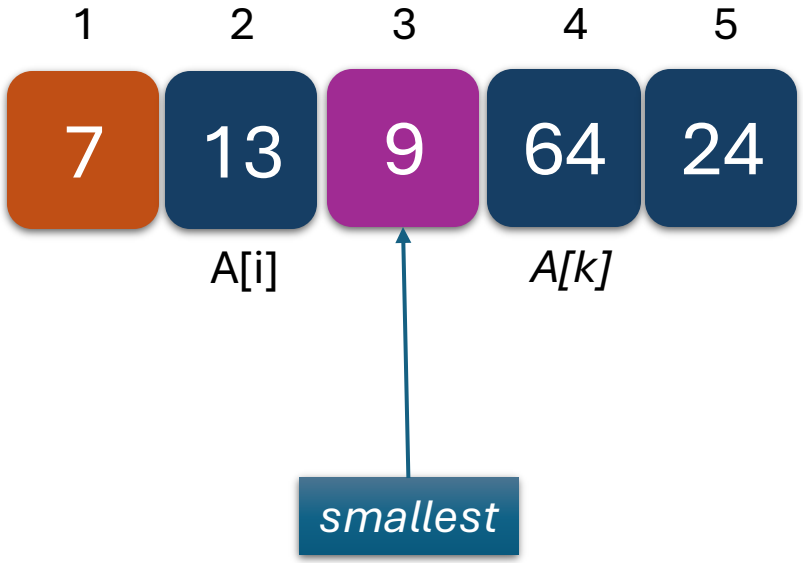
i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

k=4

F

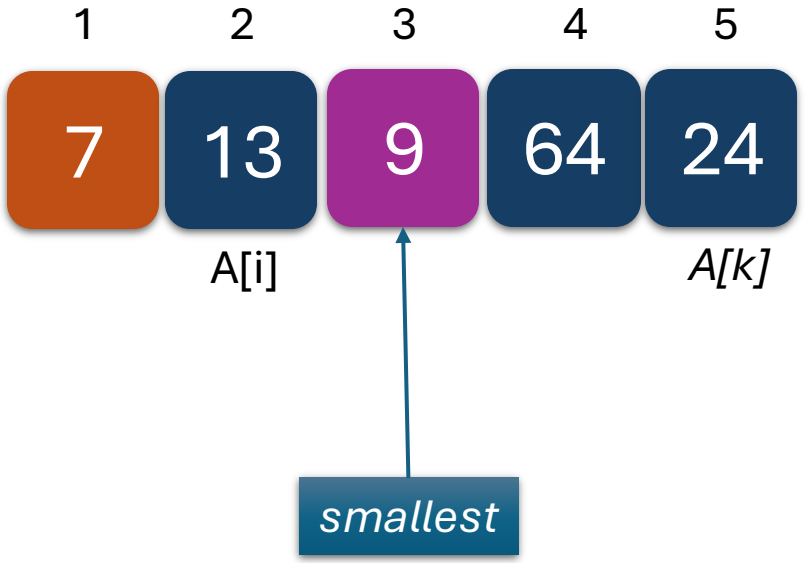
9



Total Number of iteration (inner loop):
For i = 2
4+ (1+1)

i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:        k=5
        if A[k] < ith_smallest :    F
            ith_smallest = A[k]     9
    swap A[i] ↔ ith_smallest
```



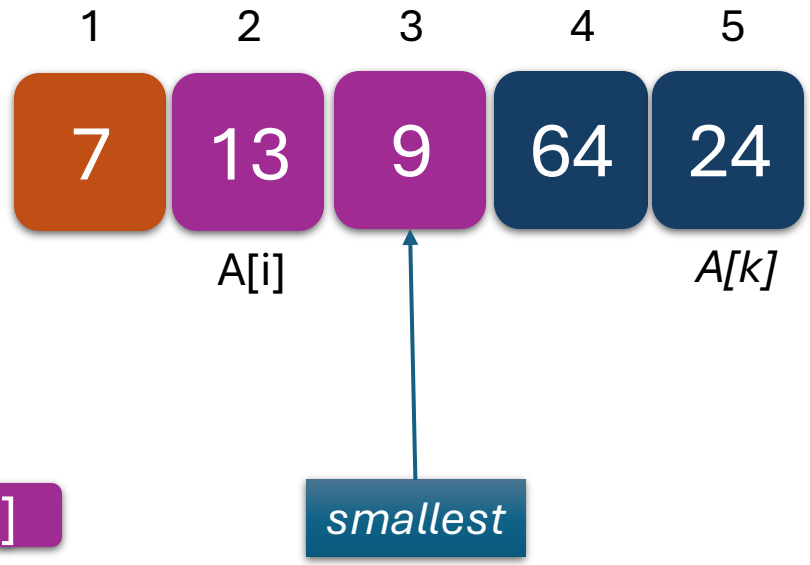
Total Number of iteration (inner loop):
For i = 2
4+ (1+1+1)

i=2

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

9

A[2] ↔ A[3]



Total Number of iteration (inner loop):
For i = 2
4+ 3

i=2

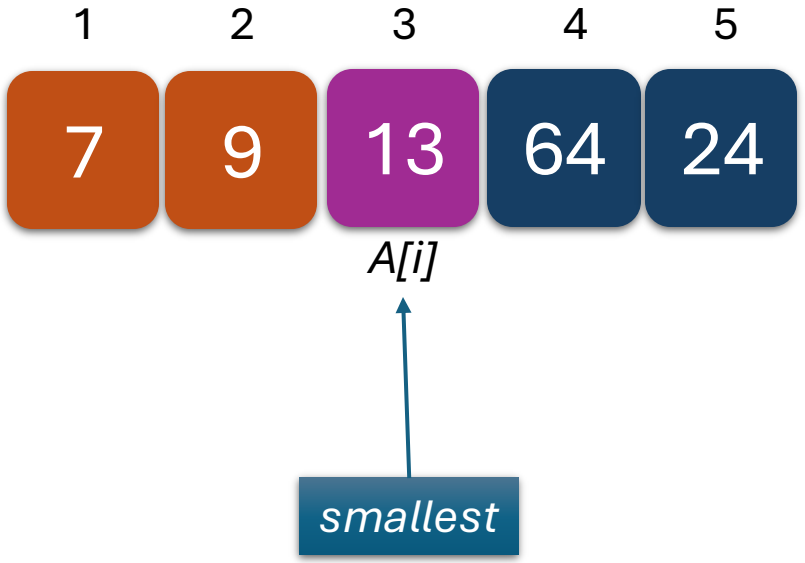
```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

9

A[2] ↔ A[3]

i=3

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]        13
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 3
4+ 3+()

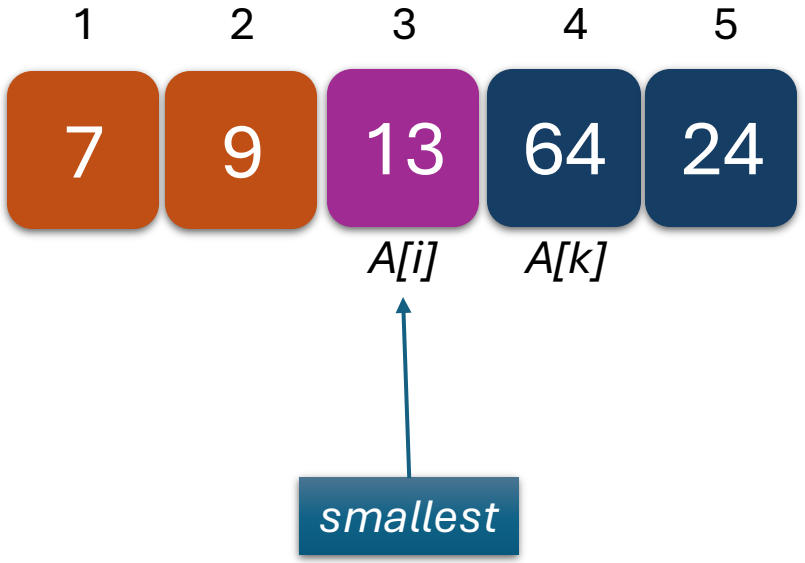
i=3

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

13

k=4

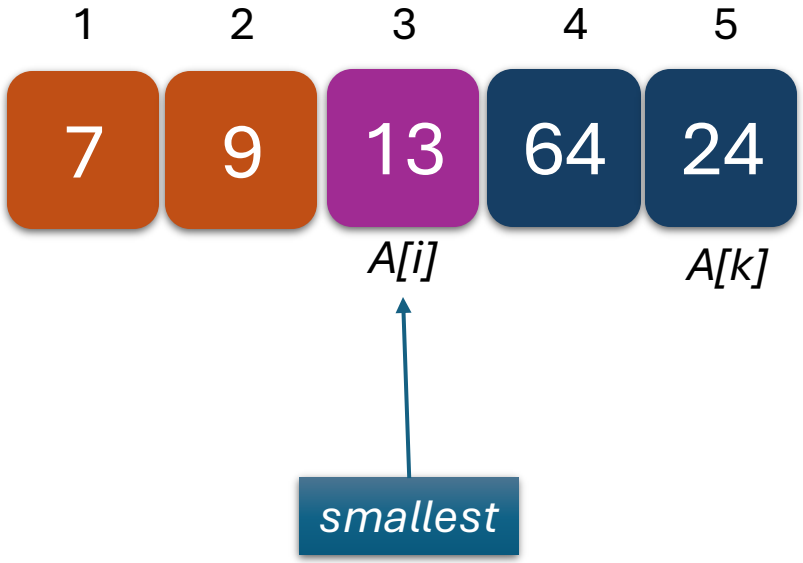
F



Total Number of iteration (inner loop):
For i = 3
4+ 3+(1)

i=3

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]          13
    for k = i + 1 to N:          k=5
        if A[k] < ith_smallest :     F
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 3
4+ 3+(1+1)

i=3

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

13

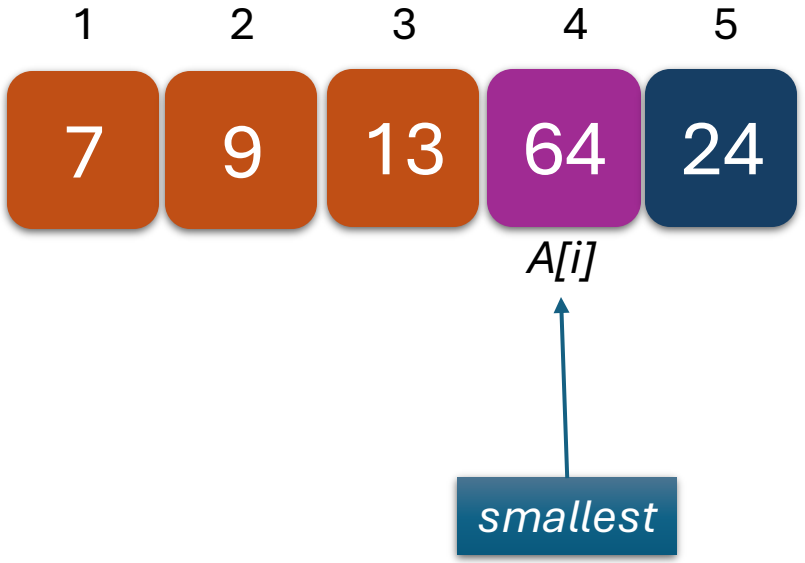
k=5

A[3] ↔ A[3]

Total Number of iteration (inner loop):
For i = 3
4+ 3+2

i=4

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]        64
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 4
4+ 3+2+()

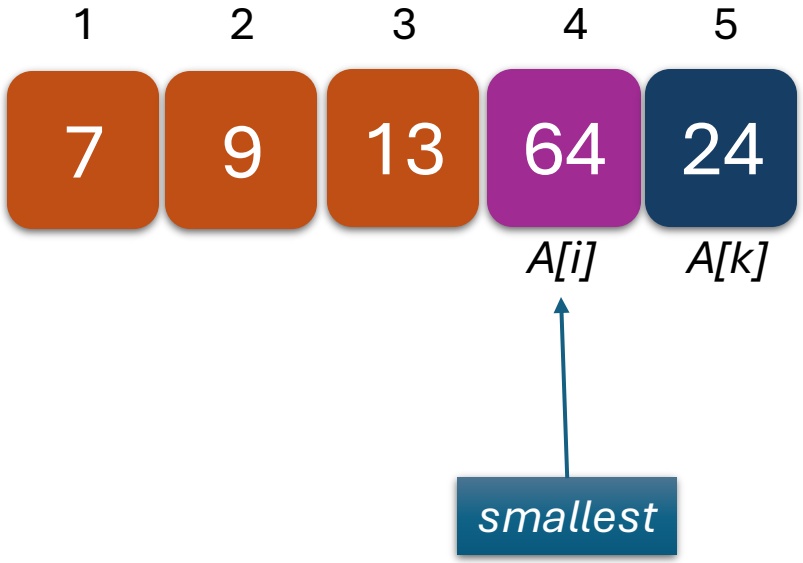
i=4

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

64

k=5

T



Total Number of iteration (inner loop):
For i = 4
4+ 3+2+(1)

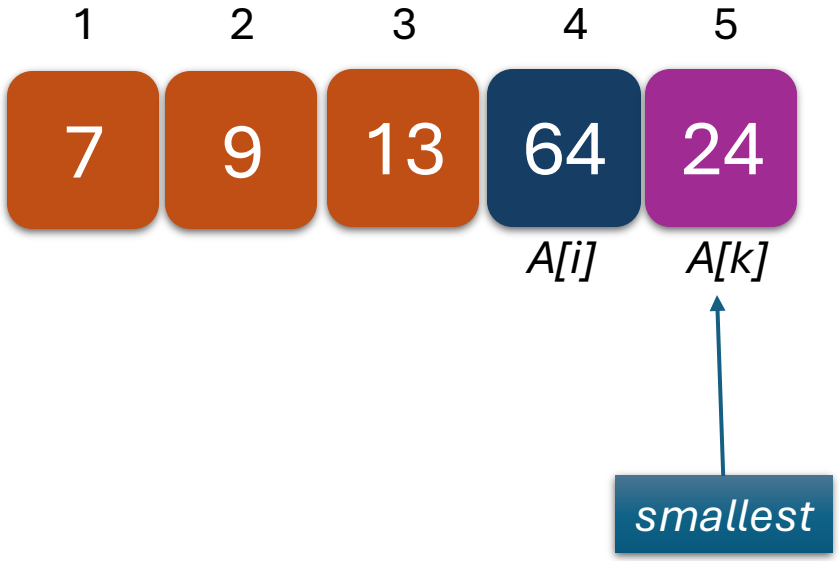
i=4

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

k=5

T

24



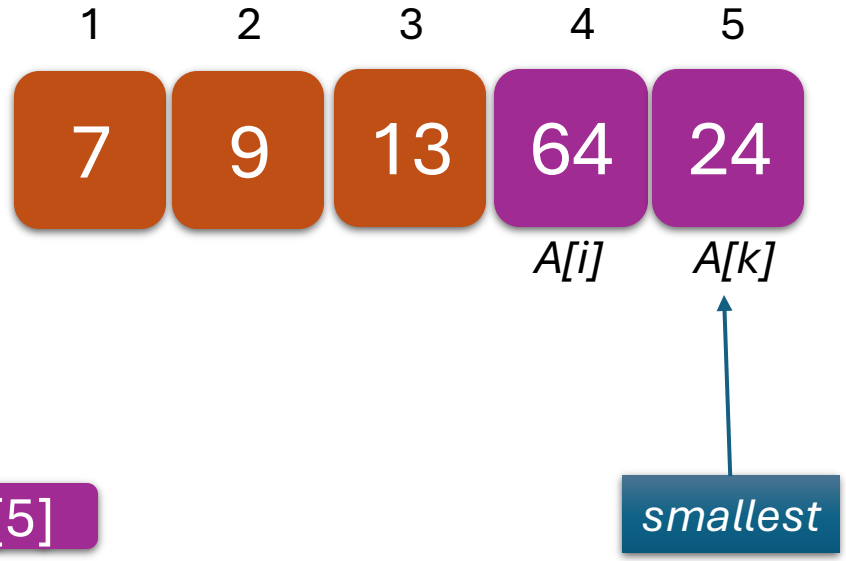
i=4

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

k=5

24

A[4] ↔ A[5]



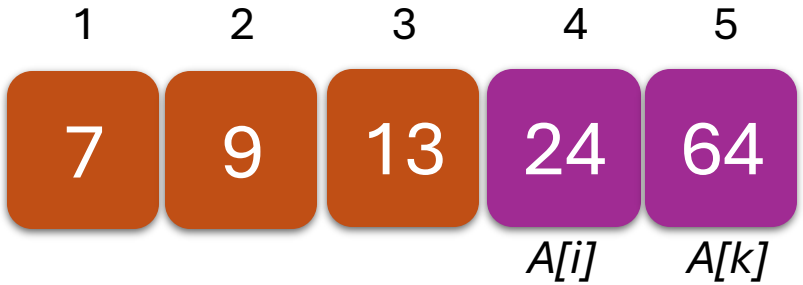
i=4

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

k=5

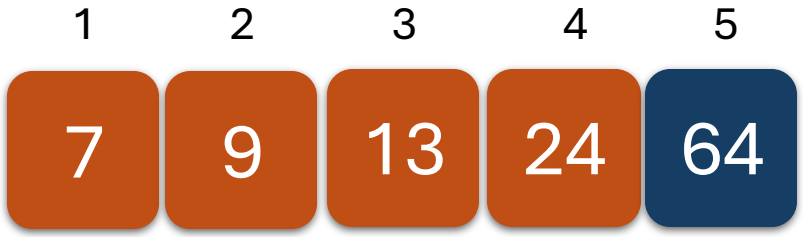
24

A[4] ↔ A[5]



i=4

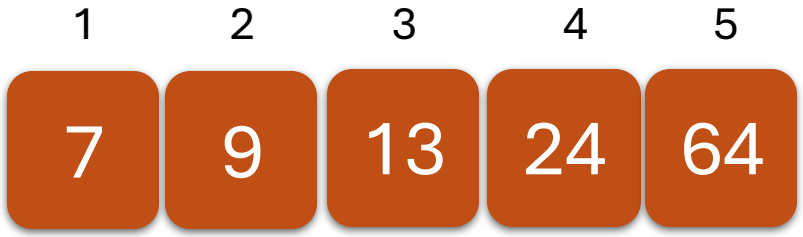
```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Total Number of iteration (inner loop):
For i = 4
4+ 3+2+1+0

i=5

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```



Selection Sort Complexity

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

Best Case?

Worst Case?

Both **$O(n^2)$**

Selection Sort Complexity

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

C_1	n
$C_2[(n-1)+(n-2)+...+2+1]$	n
C_3	n

- **Outer for-loop**
  - runs from 1 to N
- **Inner for-loop**
  - finding the ith smallest element
  - runs from i+1 to N (dependent on iteration number)

$$T(n) = c_1(n)+(n(n-1)/2)c_2+ c_3(n)$$
$$= O(n^2)$$

Insertion Sort Complexity

```
insertion_sort(array A):
    for i = 1 to N:
        item = A[i]
        left = i – 1
        while left > 0 and A[left ] > item :
            A[left + 1] = A[left ]
            left = left – 1
    A[left + 1] = item
```

Best Case?

Worst Case?

RT is $O(N^2)$ regardless of whether the array is already sorted, in reverse order, or in random order; the algorithm will still naively look for the i-th smallest element per iteration, without learning anything.

Selection Sort Complexity

```
selection_sort(array A):
for i = 1 to N:
    ith_smallest = A[i]
    for k = i + 1 to N:
        if A[k] < ith_smallest :
            ith_smallest = A[k]
    swap A[i] ↔ ith_smallest
```

C_1		n
$C_2[(n-1)+(n-2)+...+2+1]$		n
C_3		n

Example:

N = 5

Iteration1	i = 1 k = 2 to 5	inner loop = 4 iterations
Iteration 2	i = 2 k = 3 to 5	inner loop = 3 iterations
Iteration 3	i = 3 k = 4 to 5	inner loop = 2 iterations
Iteration 4	i = 4 k = 5	inner loop = 1 iteration
Iteration 5	i = 5 k = None	inner loop = 0 iterations

Selection Sort Complexity

- Memory: O(1) → no extra memory needed

Bubble Sort

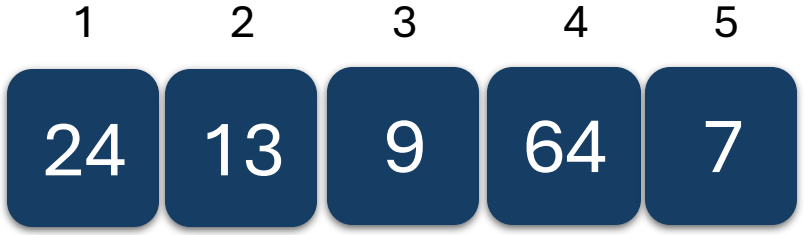
Bubble Sort

- Works by repeatedly swapping adjacent elements that are out of order
- Small numbers bubble up the array during execution
- At the end of each loop iteration, first i elements are sorted
- Stop if no swaps happened anymore → array is sorted

Bubble Sort

```
bubble_sort(array A):
    do:
        for each adjacent pair of items:
            swap if not in order
    while a swap occured
```

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```



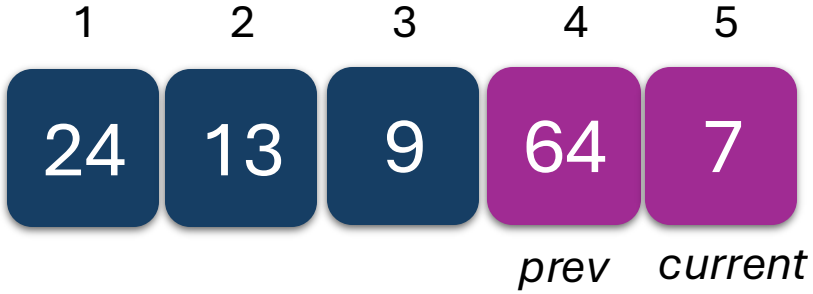
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

5

4

T

First pass



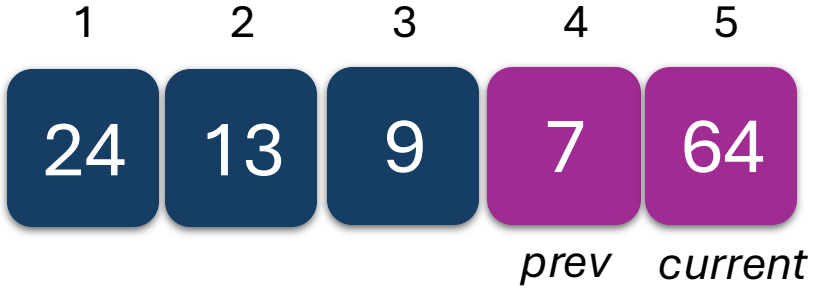
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

5

4

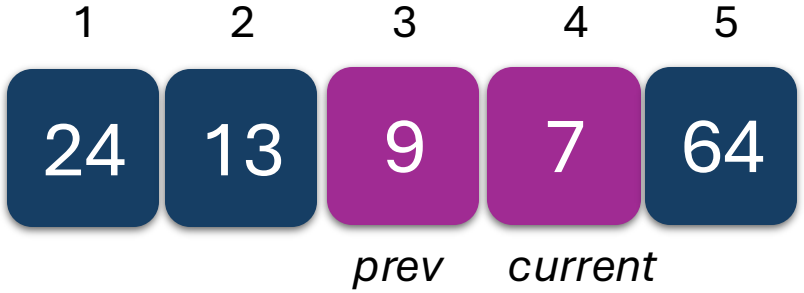
T

First pass
Swapped=True



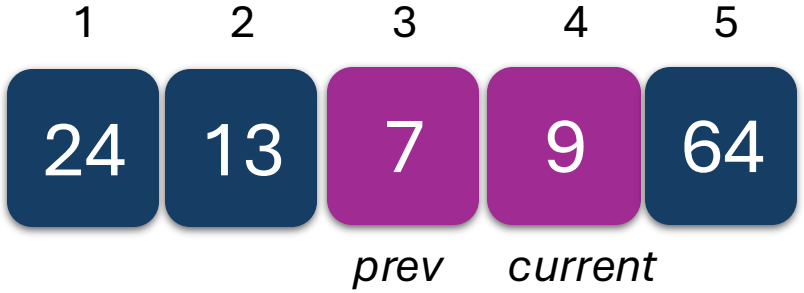
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        4
            prev = current – 1       3
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=True



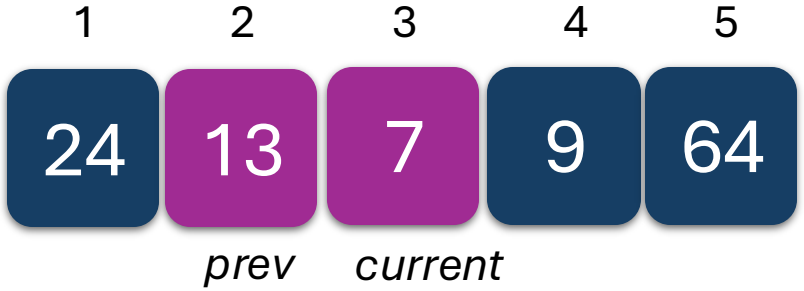
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        4
            prev = current – 1       3
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=True



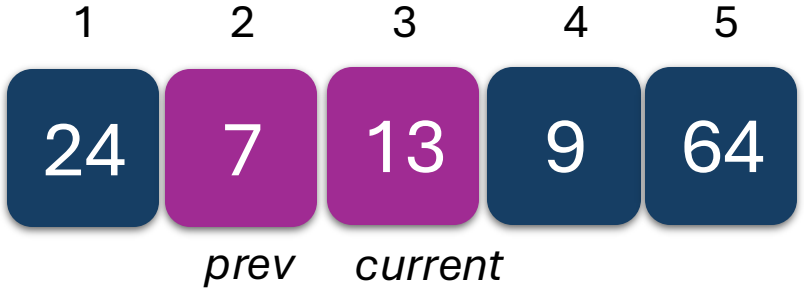
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        3
            prev = current – 1       2
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=True



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        3
            prev = current – 1       2
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=True



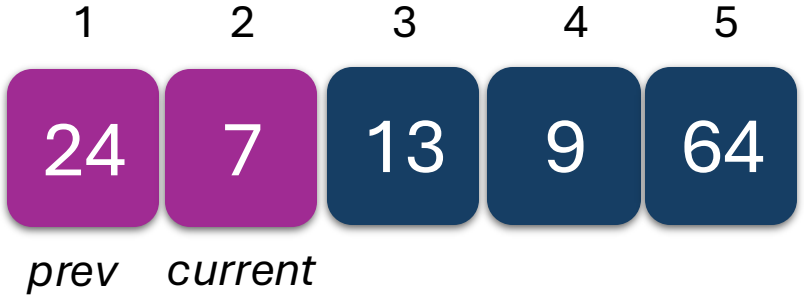
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

2

1

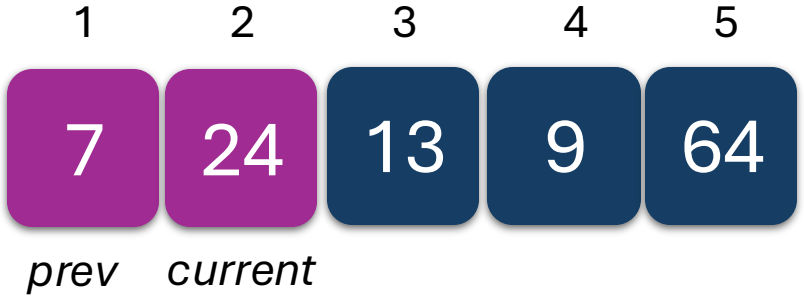
T

First pass
Swapped=True



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        2
            prev = current – 1       1
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=True



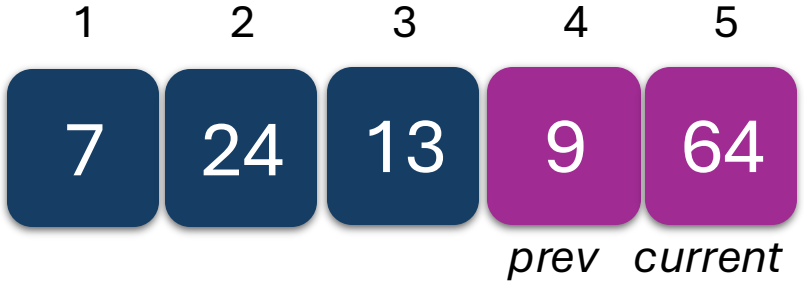
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

5

4

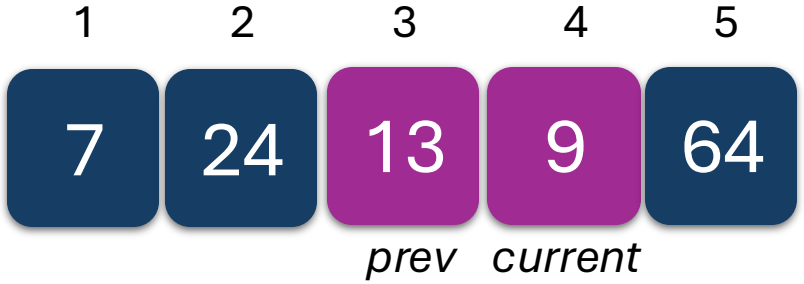
F

Second pass
Swapped=False



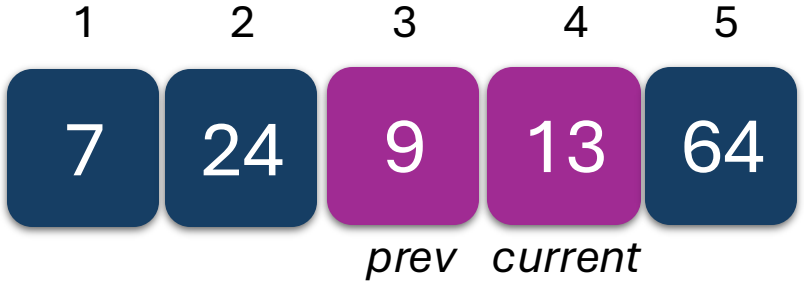
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          4
            prev = current – 1         3
            if A[prev] > A[current]:   T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Second pass
Swapped=False



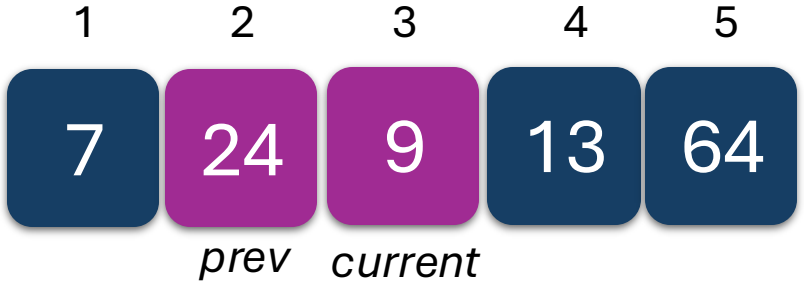
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          4
            prev = current – 1         3
            if A[prev] > A[current]:   T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Second pass
Swapped=True



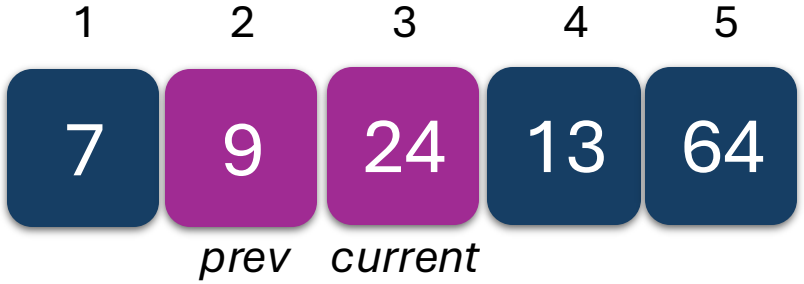
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        3
            prev = current – 1       2
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Second pass
Swapped=True



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          3
            prev = current – 1         2
            if A[prev] > A[current]:   T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Second pass
Swapped=True



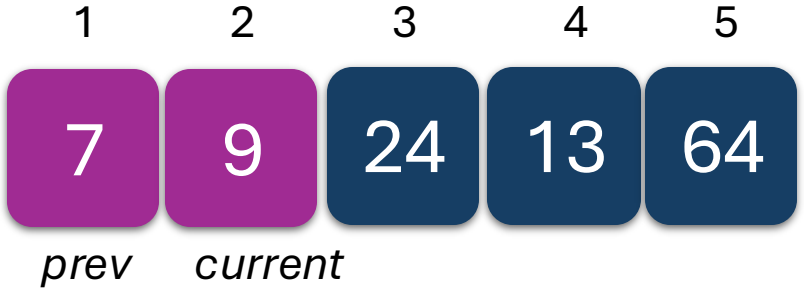
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

2

1

F

Second pass
Swapped=True



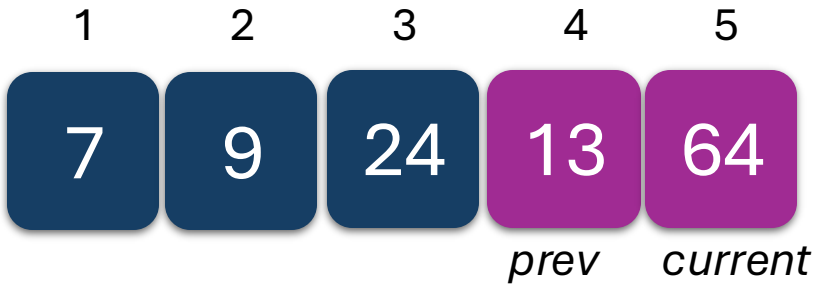
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

5

4

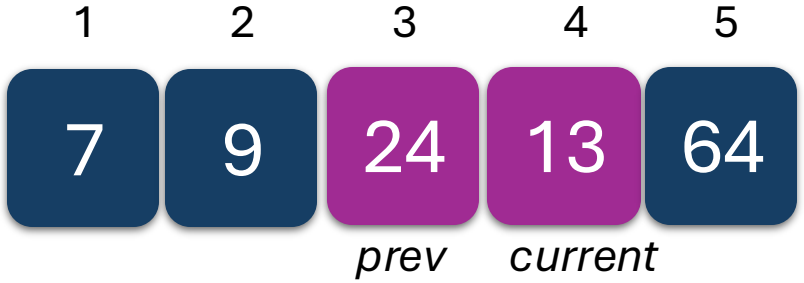
F

Third pass
Swapped=False



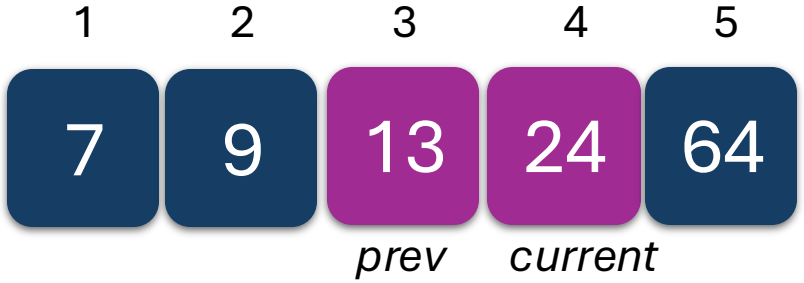
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          4
            prev = current – 1         3
            if A[prev] > A[current]:   T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Third pass
Swapped=False



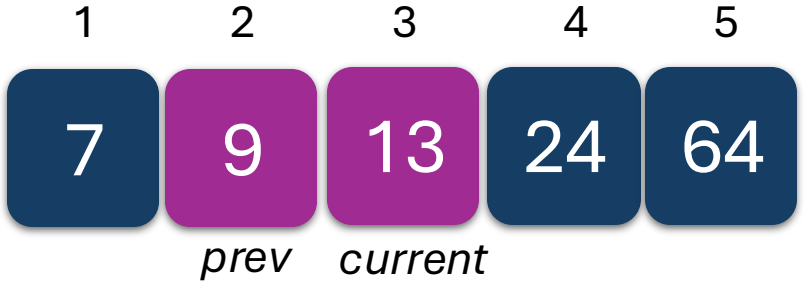
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        4
            prev = current – 1       3
            if A[prev] > A[current]: T
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Third pass
Swapped=True



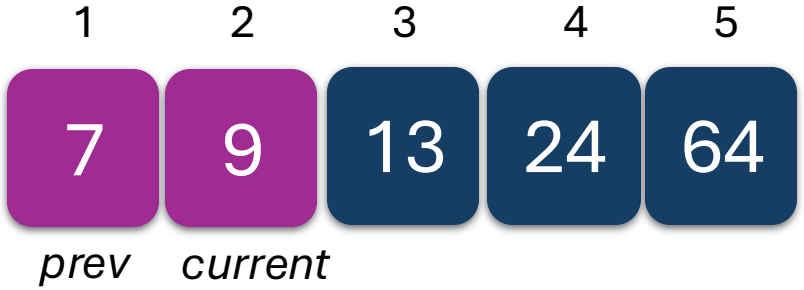
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        3
            prev = current – 1       2
            if A[prev] > A[current]: F
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Third pass
Swapped=True



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          2
            prev = current – 1         1
            if A[prev] > A[current]:   F
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Third pass
Swapped=True



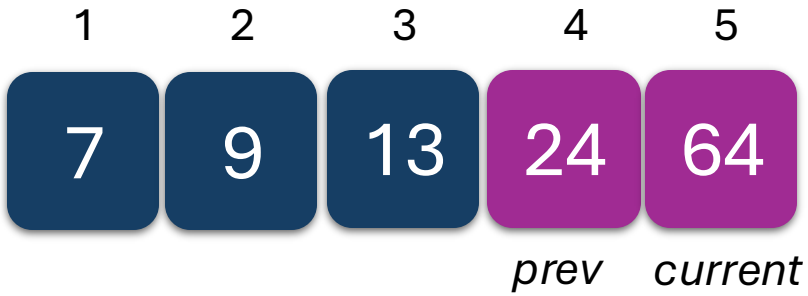
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

5

4

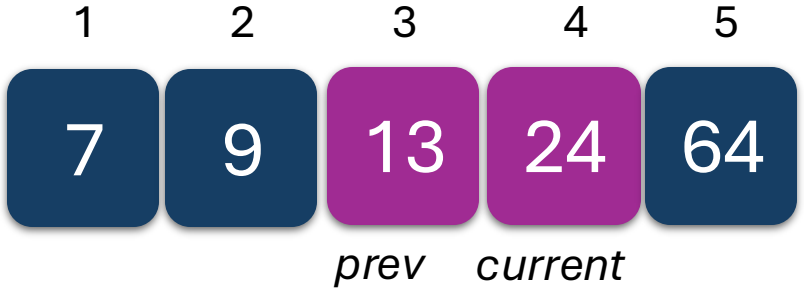
F

Fourth pass
Swapped=False



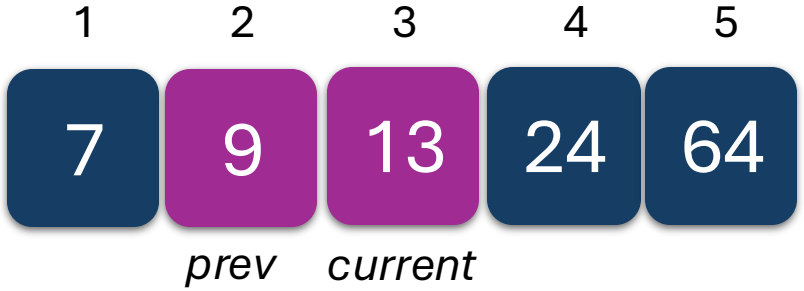
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          4
            prev = current – 1         3
            if A[prev] > A[current]:   F
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Fourth pass
Swapped=False



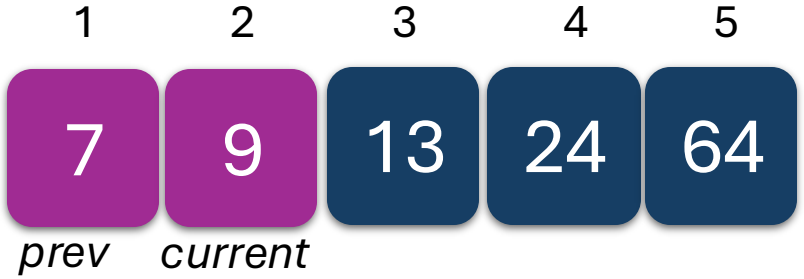
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:        3
            prev = current – 1       2
            if A[prev] > A[current]: F
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Fourth pass
Swapped=False



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:          2
            prev = current – 1         1
            if A[prev] > A[current]:   F
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Fourth pass
Swapped=False



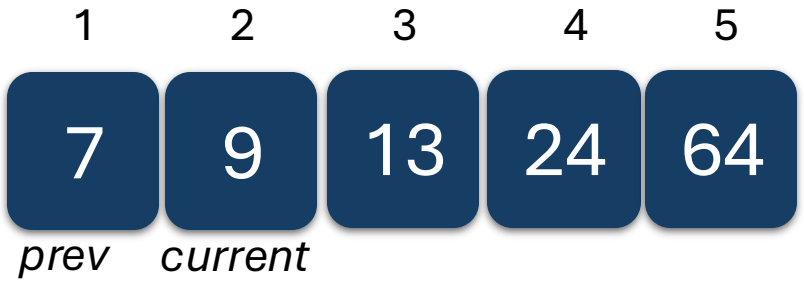
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

2

1

F

Fourth pass
Swapped=False



Bubble Sort Complexity

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Best Case?

Worst Case?

Bubble Sort Complexity

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Outer Loop:
no. of iterations depend on the input structure (sorted, reverse sorted, random)

Inner Loop:
runs from N to 1 → O(N)

Bubble Sort Complexity

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Best Case?

input is already sorted → do-while loop will only run once, since no more swaps will happen

O(N) → outer do-while loop is 1 iteration x inner loop is N iterations

Bubble Sort Complexity

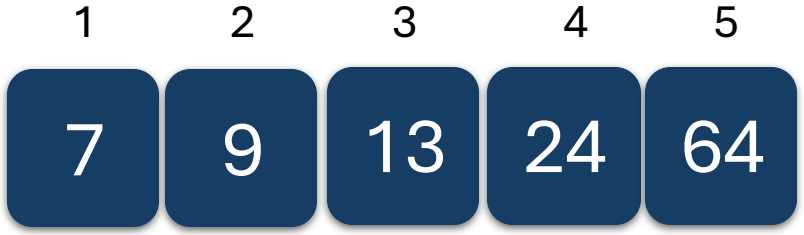
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Outer Loop:
C_1 1

Inner Loop:
C_2 n

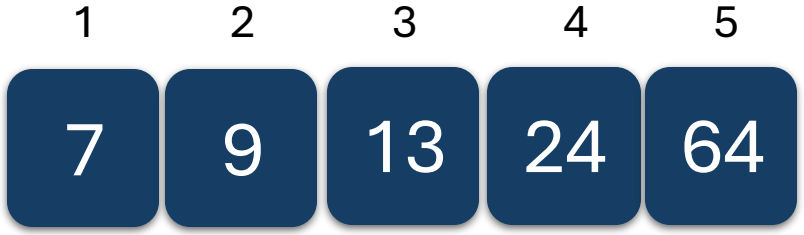
$$T(n) = c_1(1) + c_1(n)$$
$$= O(n)$$

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```



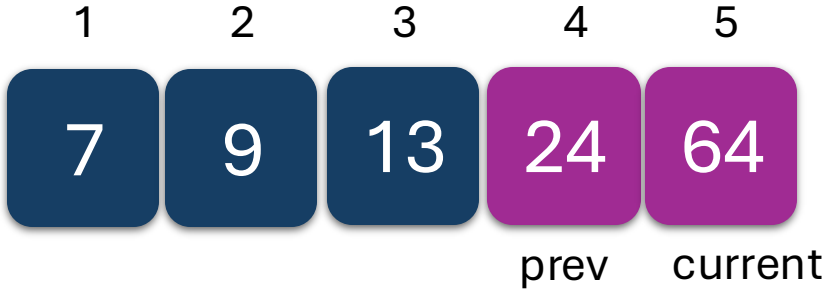
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



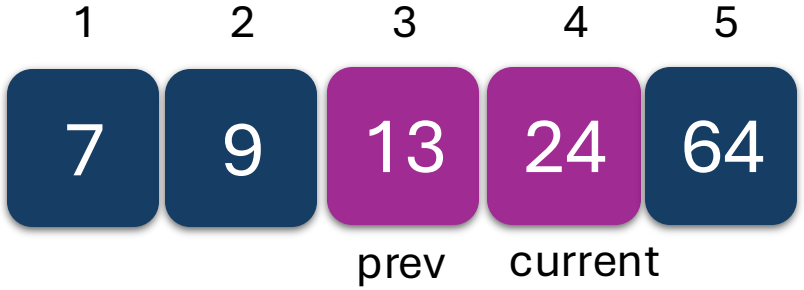
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



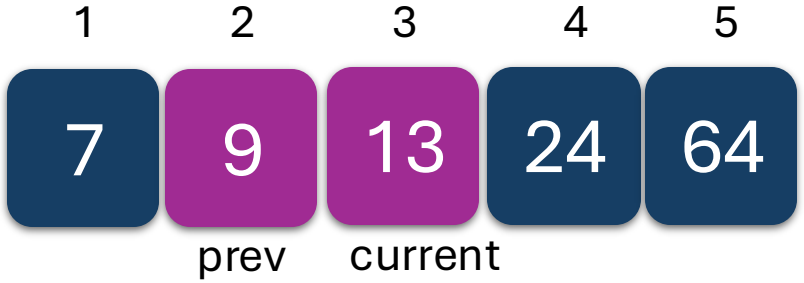
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



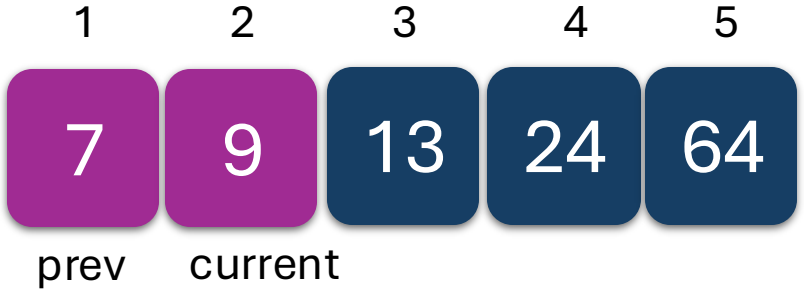
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



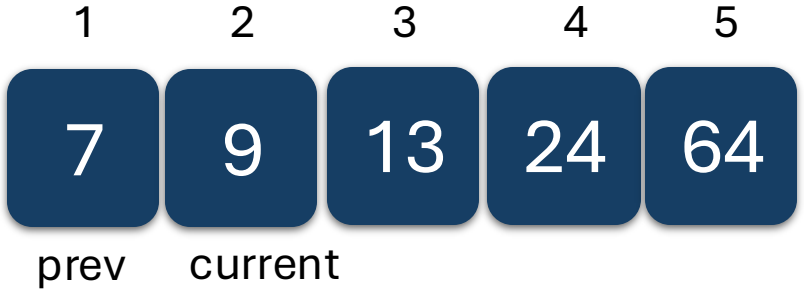
```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

First pass
Swapped=False



Do while exits since swapped=False

Only 1 pass!

Bubble Sort

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Worst Case?

- input is reverse sorted
- do-while loop needs N iterations; in each iteration, the ith smallest element will bubble up to the ith-position (correct position)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Outer Loop:
n times

Inner Loop:
runs from N to 1 → O(N)

= $O(n^2)$

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

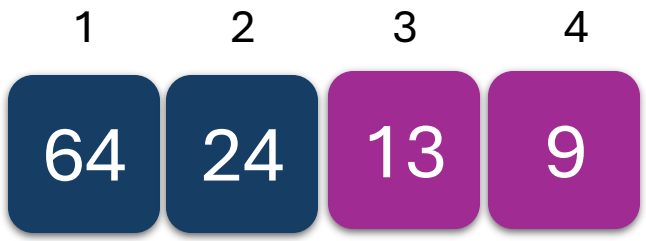
Outer Loop:
C_1 n

Inner Loop:
C_2 n

$T(n) = c_1(n) x c_2(n)$
$= O(n^2)$

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

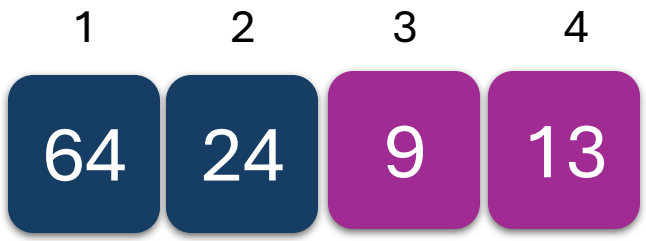
First pass
Swapped=False



Number of iterations:
First pass:

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

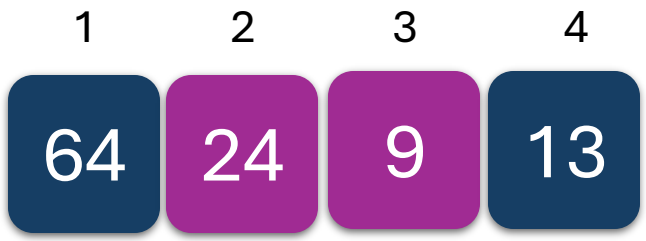
First pass
Swapped=True



Number of iterations:
First pass:
(1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

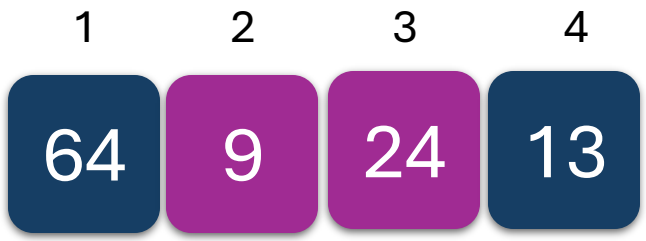
First pass
Swapped=True



Number of iterations:
First pass:
(1+1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

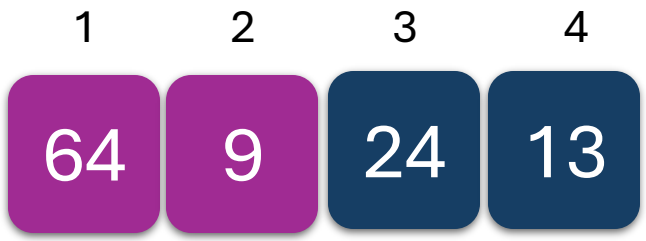
First pass
Swapped=True



Number of iterations:
First pass:
(1+1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

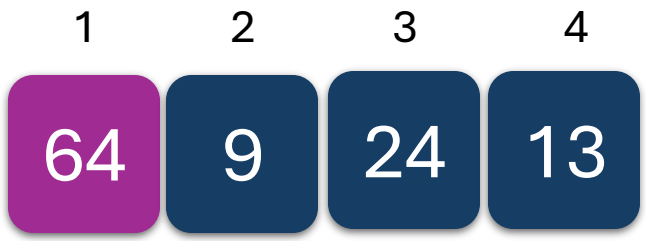
First pass
Swapped=True



Number of iterations:
First pass:
(1+1+1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

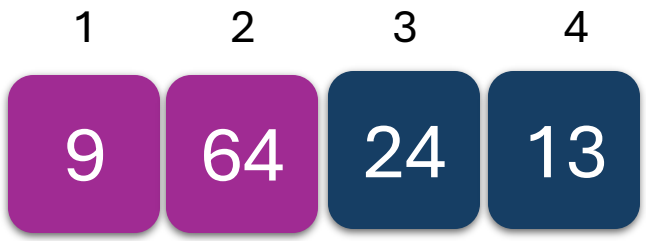
First pass
Swapped=True



Number of iterations:
First pass:
(1+1+1+1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

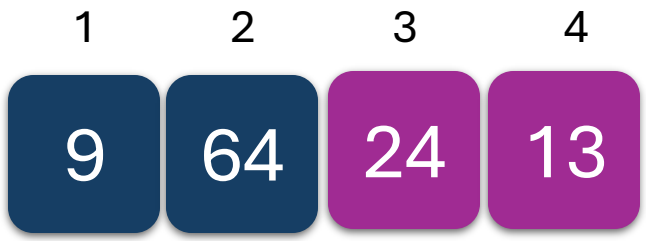
First pass
Swapped=True



Number of iterations:
First pass:
(1+1+1+1)=4

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

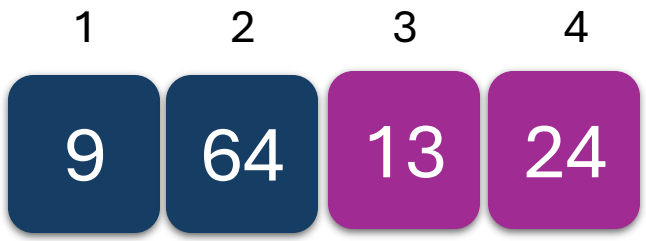
Second pass
Swapped=False



Number of iterations:
First pass:
4+(1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Second pass
Swapped=True



Number of iterations:
First pass:
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```
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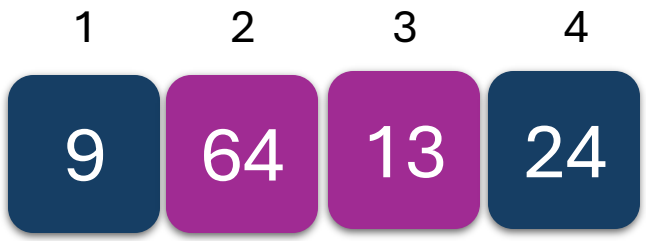
Second pass
Swapped=True



Number of iterations:
First pass:
4+(1+1)

```
bubble_sort(array A):
    do:
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        for current = N to 1:
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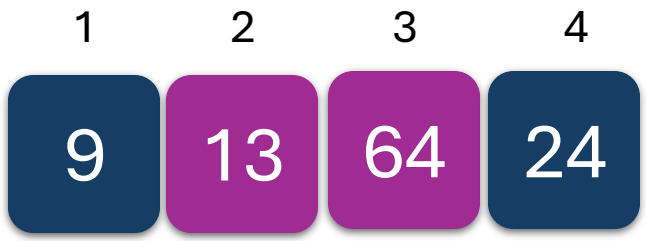
Second pass
Swapped=True



Number of iterations:
First pass:
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```
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                swapped = True
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```
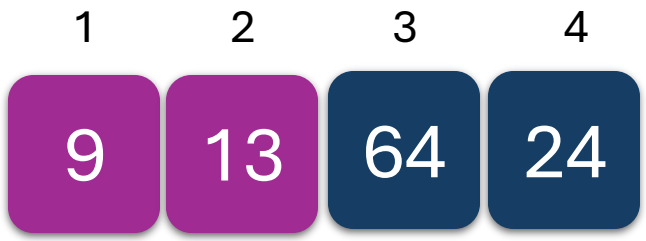

Second pass
Swapped=True



Number of iterations:
First pass:
4+(1+1+1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
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            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
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```
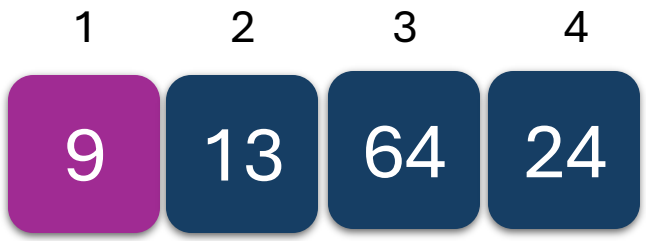
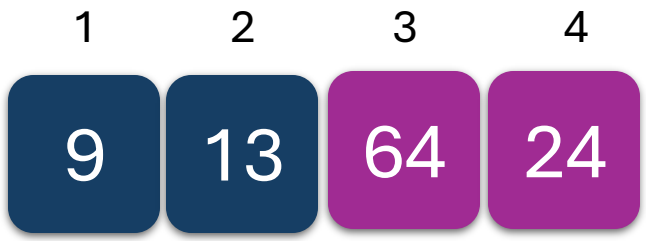

Second pass
Swapped=True



Number of iterations:
First pass:
4+4

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
            prev = current – 1
            if A[prev] > A[current]:
                swap A[prev] ↔ A[current]
                swapped = True
    while swapped = True
```

Third pass
Swapped=False



Number of iterations:
First pass:
4+4+(1)

```
bubble_sort(array A):
    do:
        swapped = False
        for current = N to 1:
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            if A[prev] > A[current]:
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```
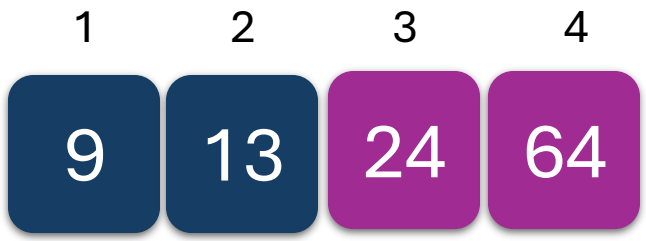

Third pass
Swapped=True



Number of iterations:
First pass:
4+4+(1)

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Third pass
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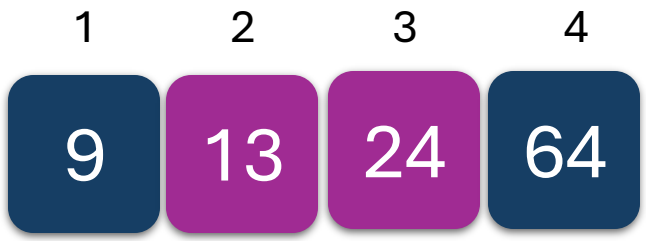

Number of iterations:
First pass:
4+4+(1+1)

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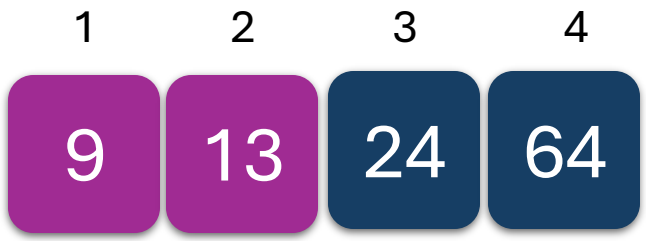

Number of iterations:
First pass:
4+4+(1+1+1)

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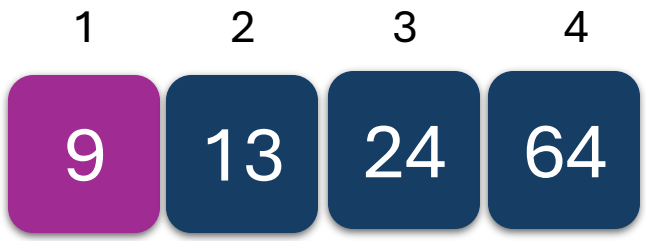
Third pass
Swapped=True



Number of iterations:
First pass:
4+4+(1+1+1+1)

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bubble_sort(array A):
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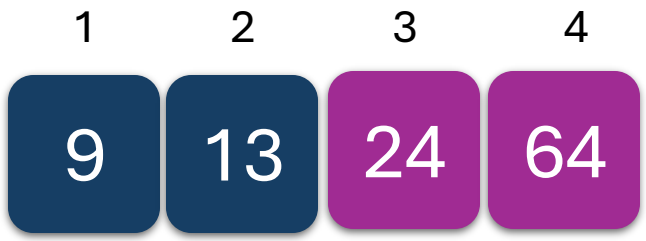
                swapped = True
    while swapped = True
```

Fourth pass
Swapped=False



Number of iterations:
First pass:
4+4+4+(1)

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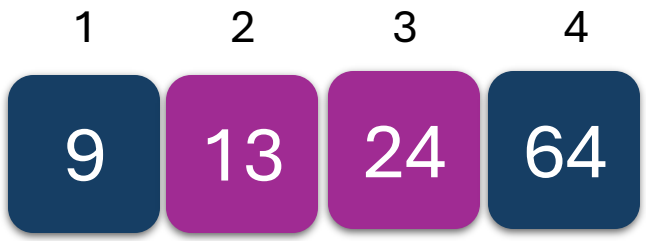

Number of iterations:
First pass:
4+4+4+(1+1)

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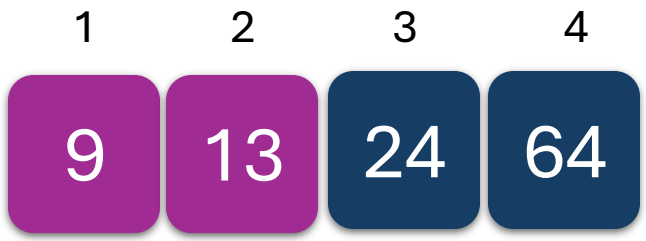
Fourth pass
Swapped=False



Number of iterations:
First pass:
4+4+4+(1+1+1)

```
bubble_sort(array A):
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Fourth pass
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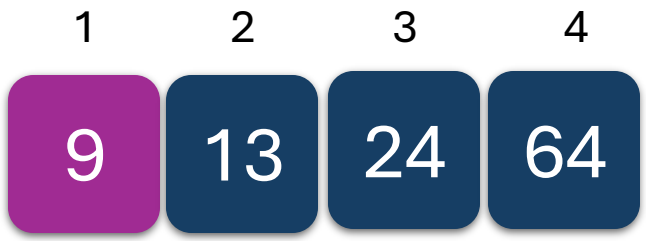

Number of iterations:
First pass:
4+4+4+(1+1+1+1)

```
bubble_sort(array A):
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        swapped = False
        for current = N to 1:
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```
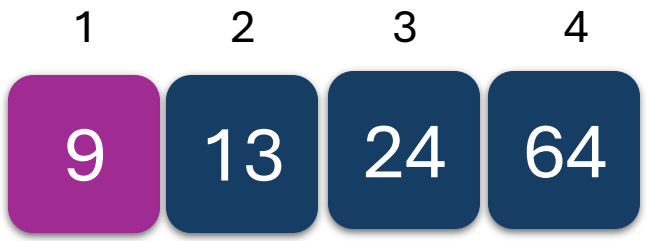

Fourth pass
Swapped=False



Total Number of iterations:
4 passes with 4 iterations each

Bubble Sort Complexity

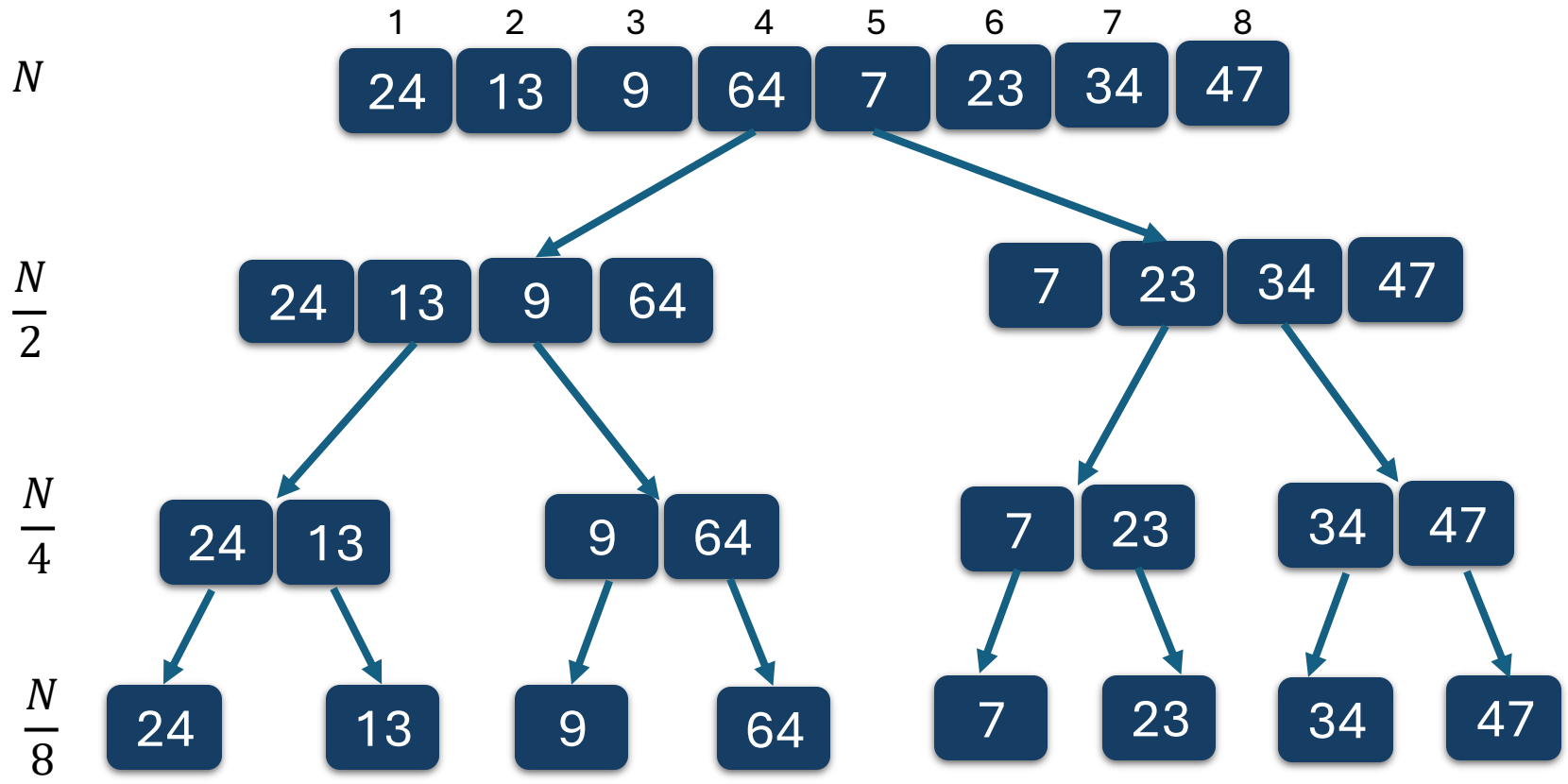
- Memory: O(1) → no extra memory needed

Merge Sort

Merge Sort

- Uses **divide-and-conquer** approach; has a recursive structure
  - **Divide:** Break problem into subproblems (similar to the original problem, but smaller in size)
  - **Conquer:** Solve the subproblems recursively
  - **Merge**: Combine subproblems' solutions to create solution to original problem
- Divide step is trivial through recursion; Merge step is where sorting happens
- During Merge, we compare the first elements of the left subproblem's solution and the right subproblem's solution → whichever is smaller gets taken first

```
merge_sort(array A):
    if N > 1:
        M = N / 2
        merge_sort(A[1 : M])
        merge_sort(A[M+1 : N])
        merge(A[1:N], M)
```



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        merge(A[1:N], M)
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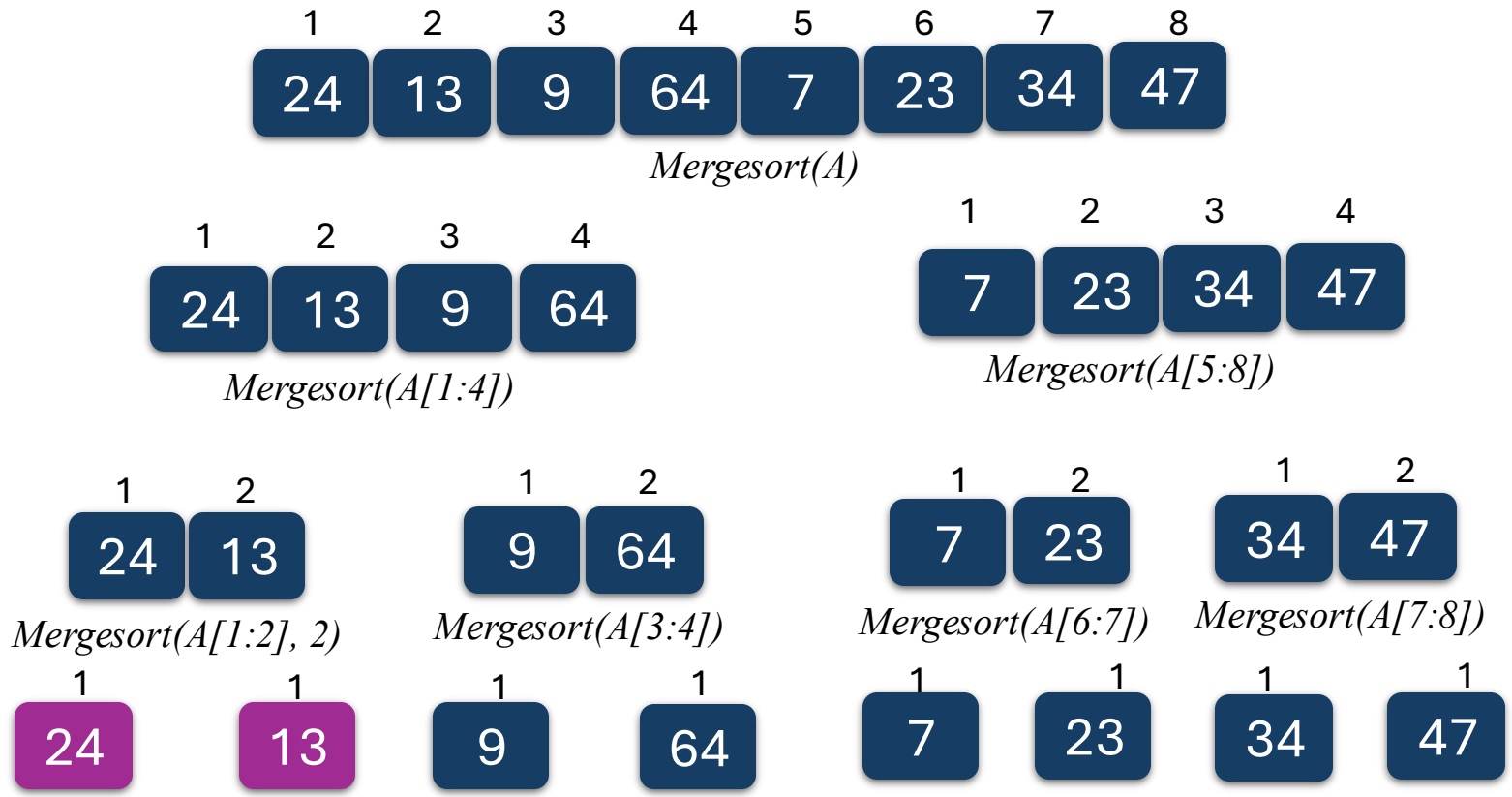
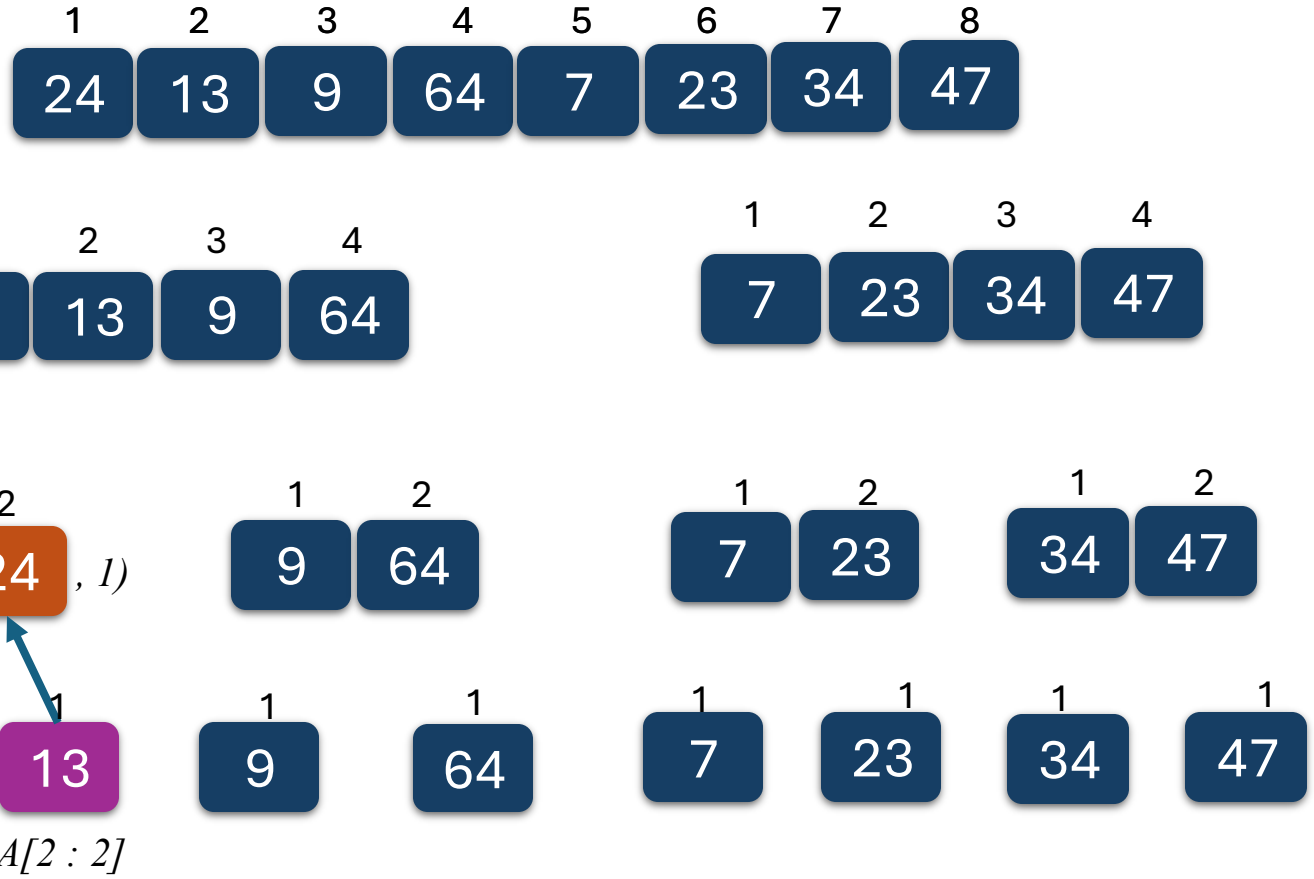


```
merge(array A, integer M):
    left_half = A[1 : M]
    right_half = A[M+1 : N]
    for i = 1 to N:
        L = first item of left_half
        R = first item of right_half
        B[i] = min(L, R)
    copy B to A
```



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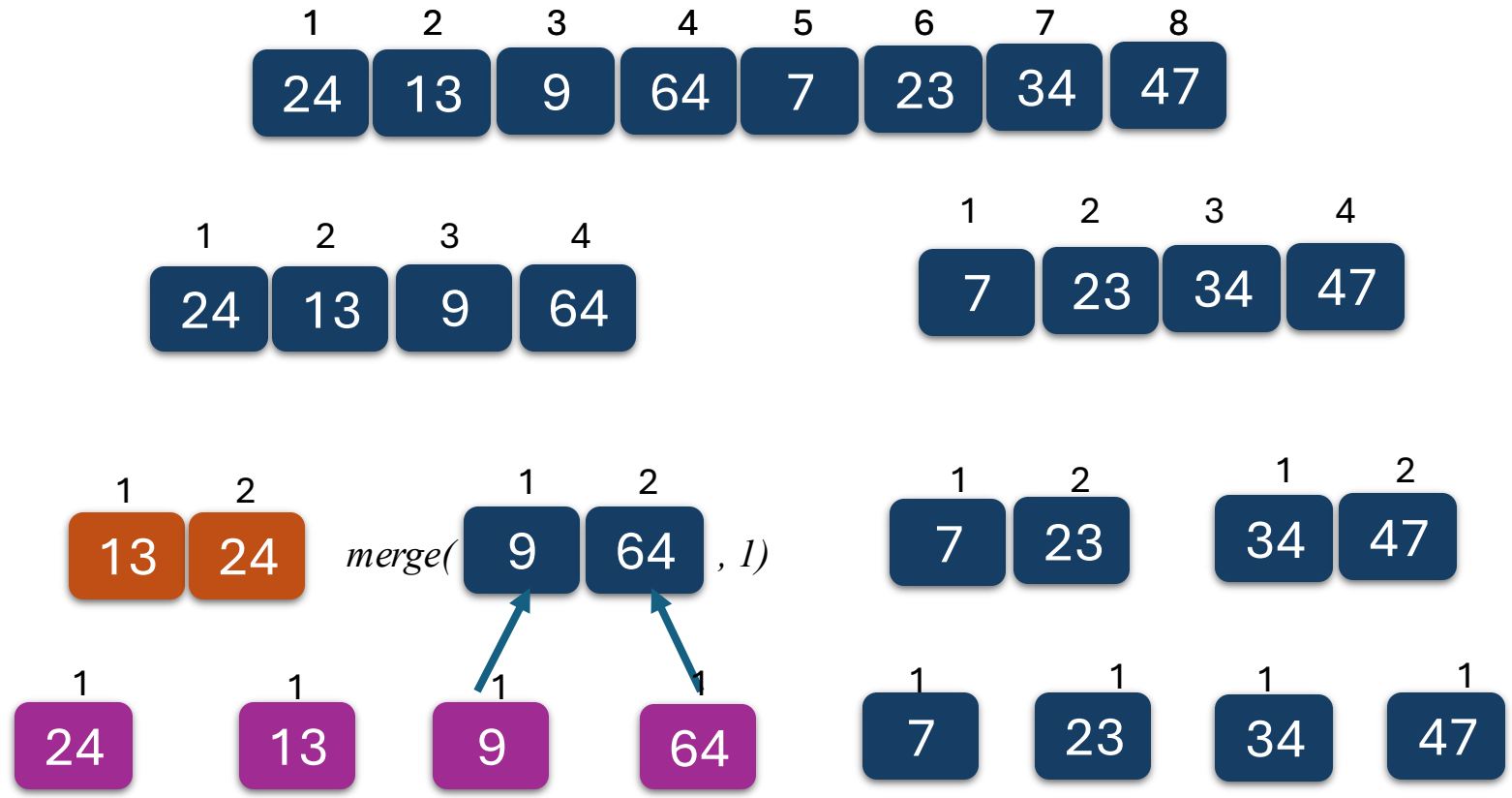

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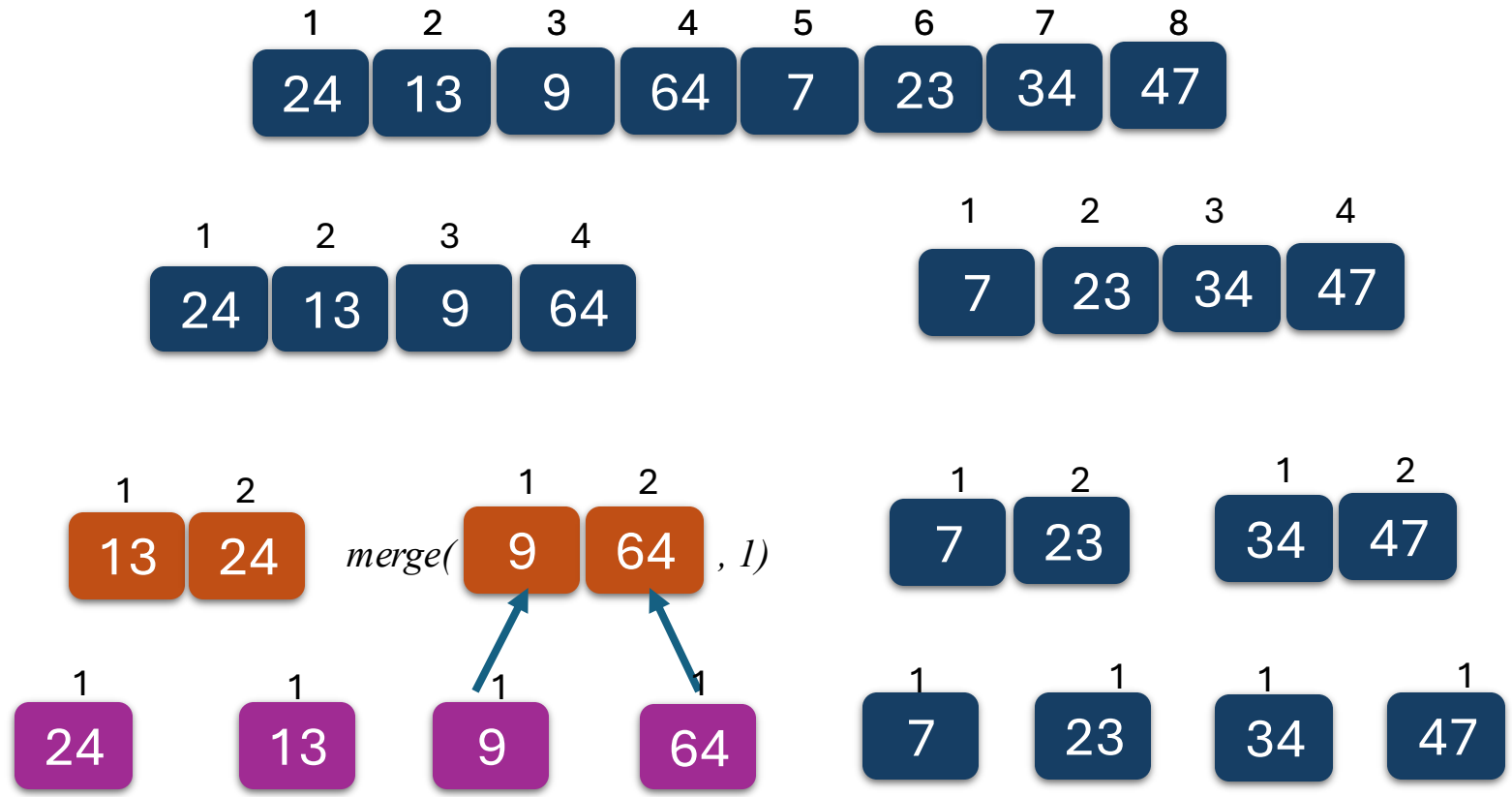

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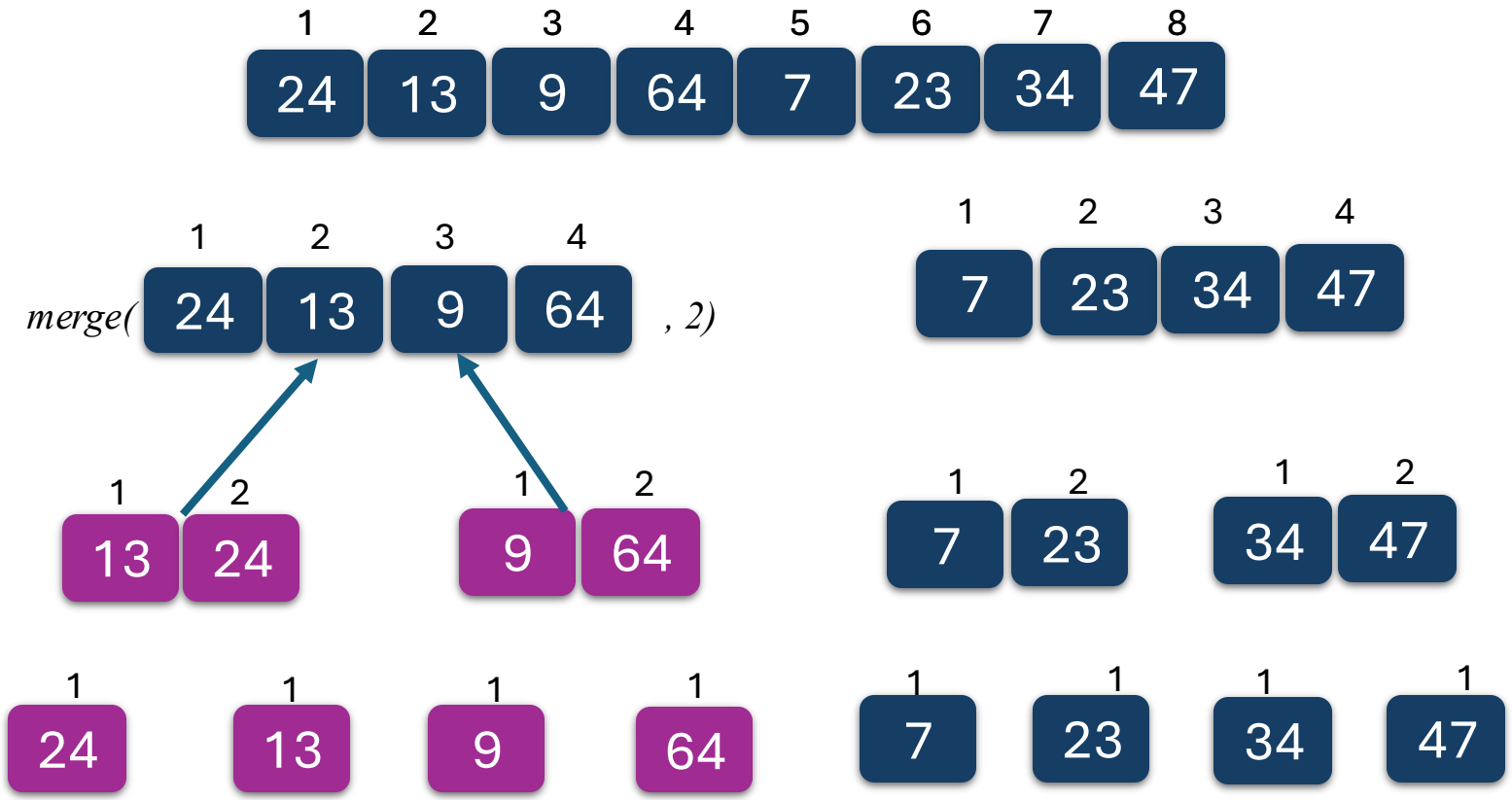

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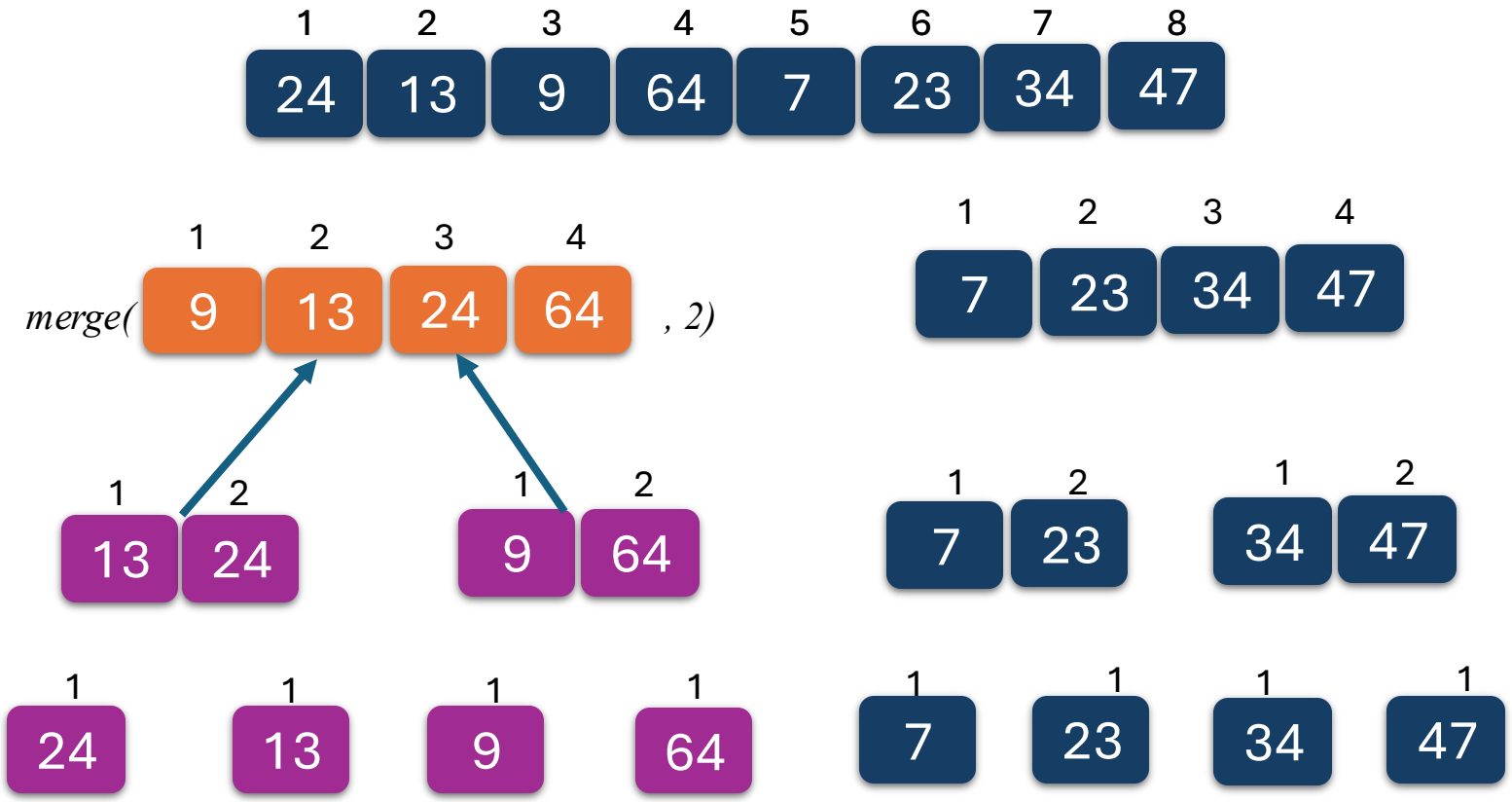

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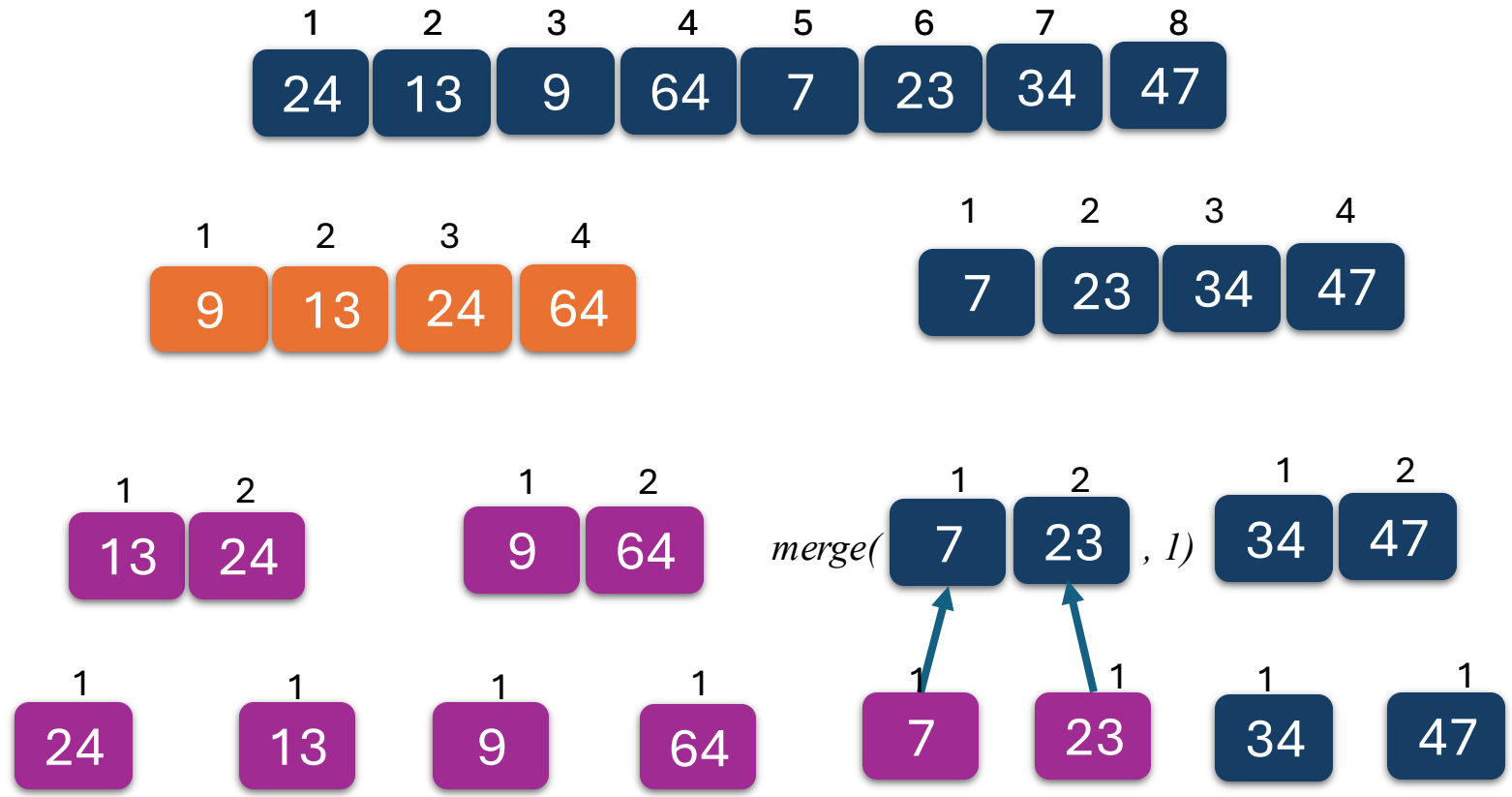

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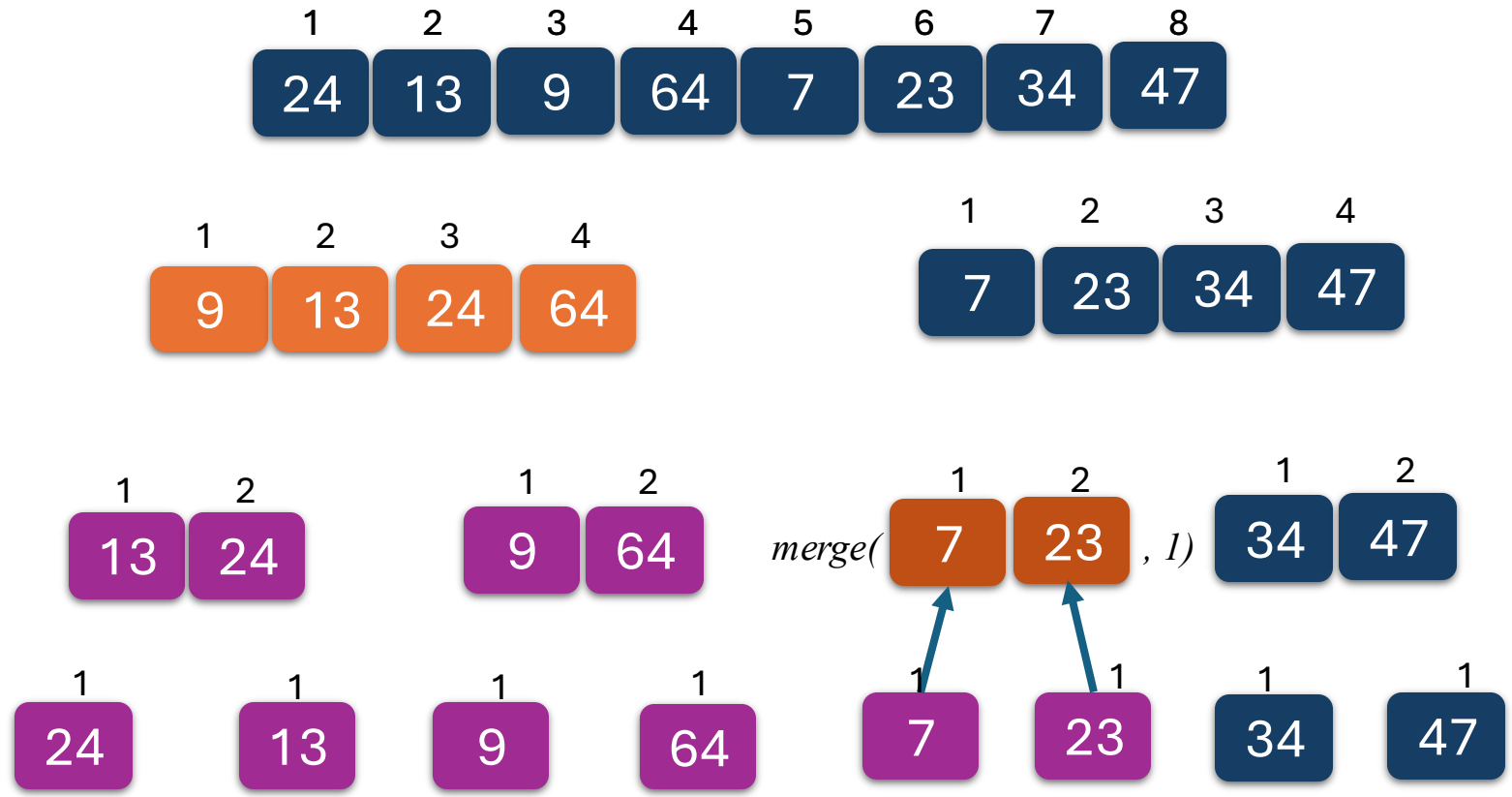

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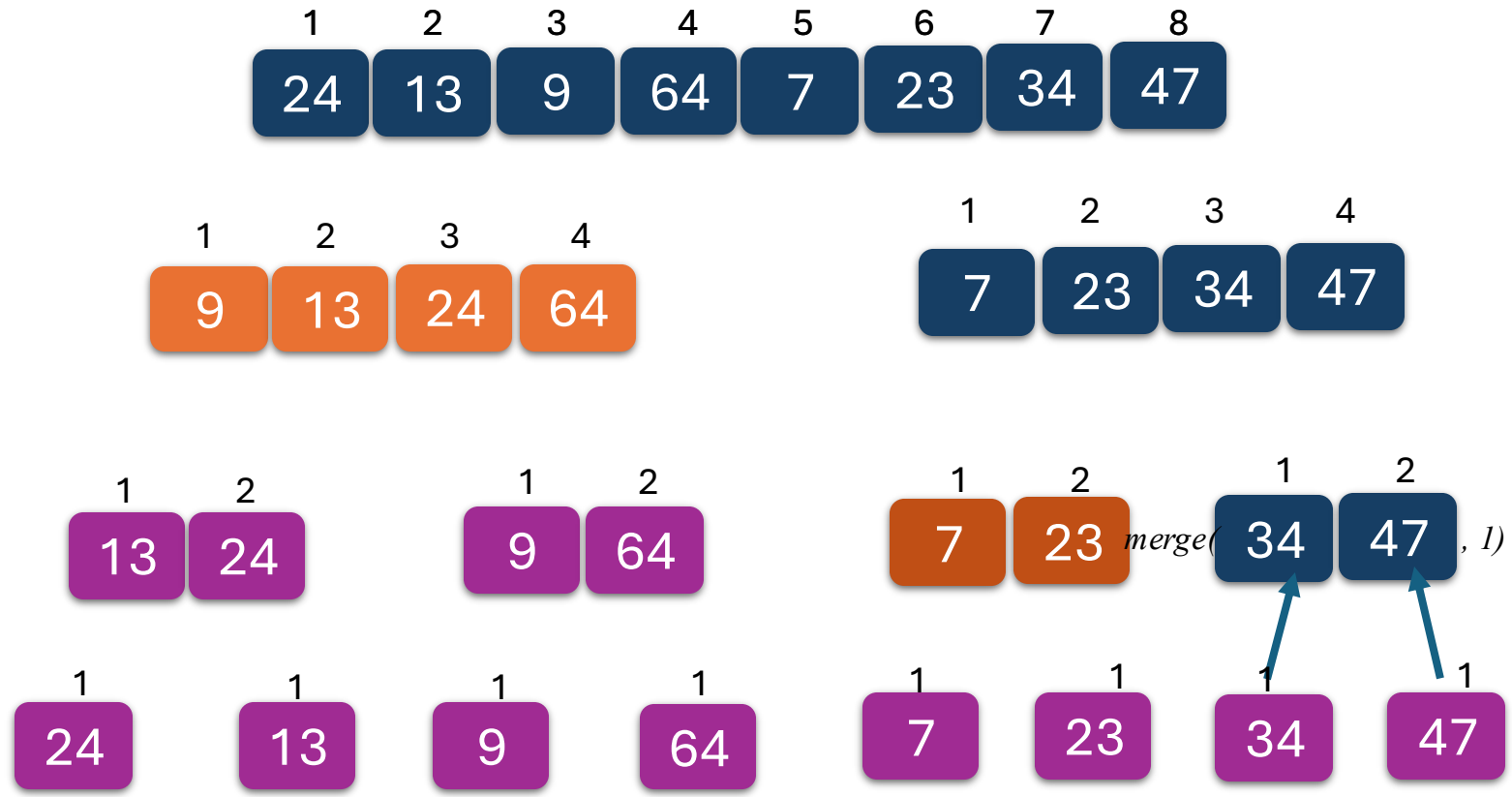

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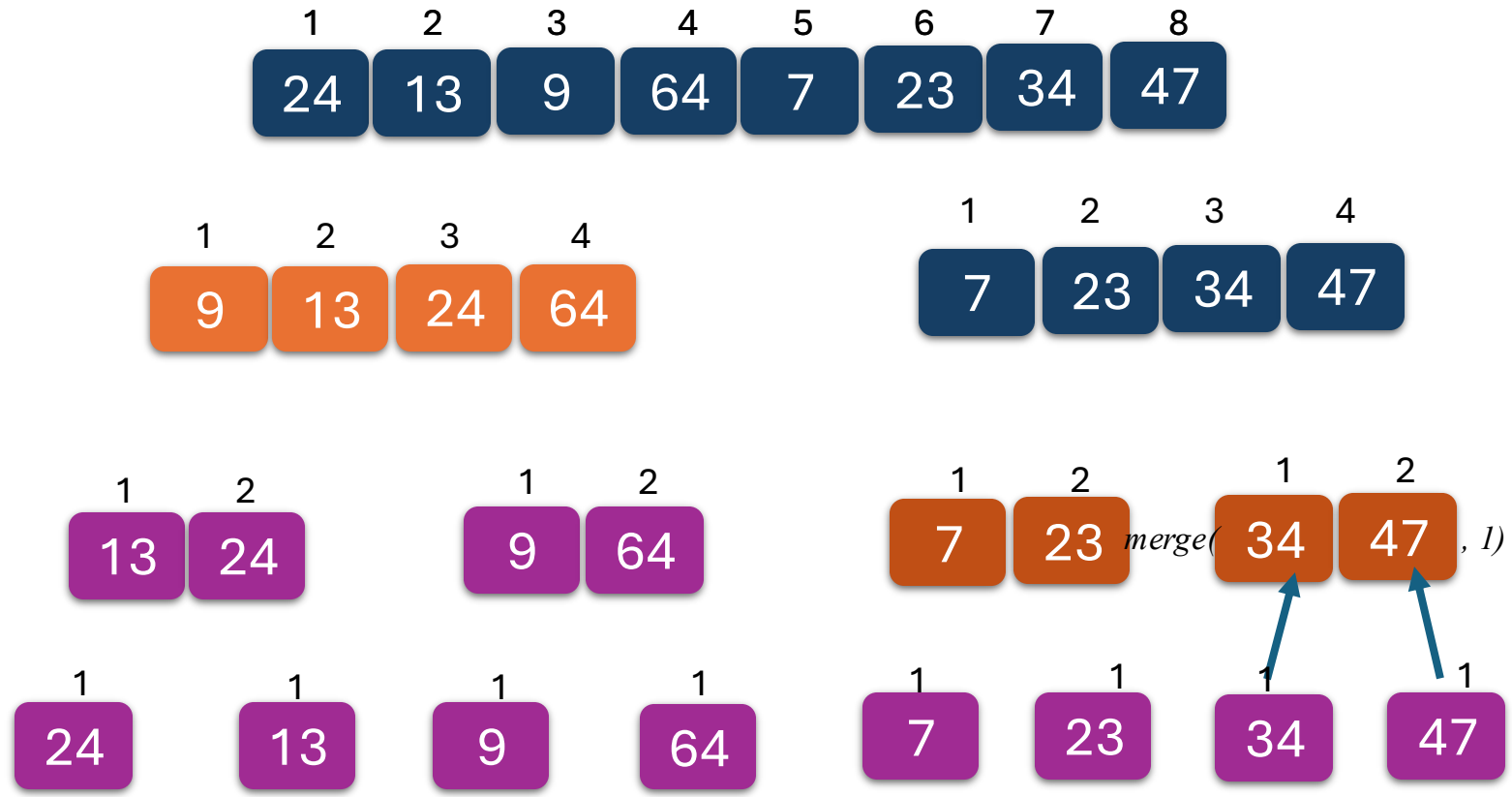

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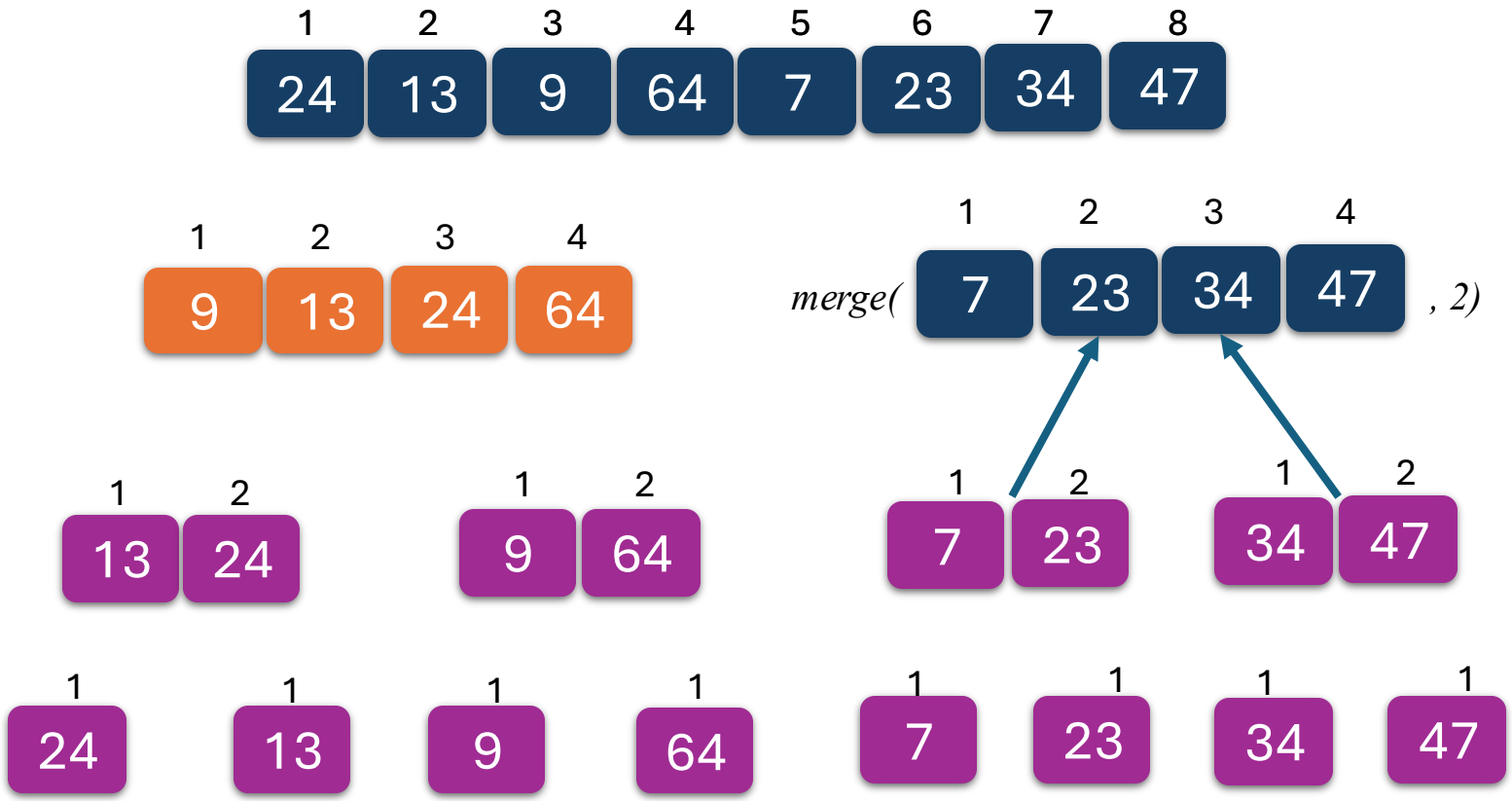

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    left_half = A[1 : M]
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    for i = 1 to N:
        L = first item of left_half
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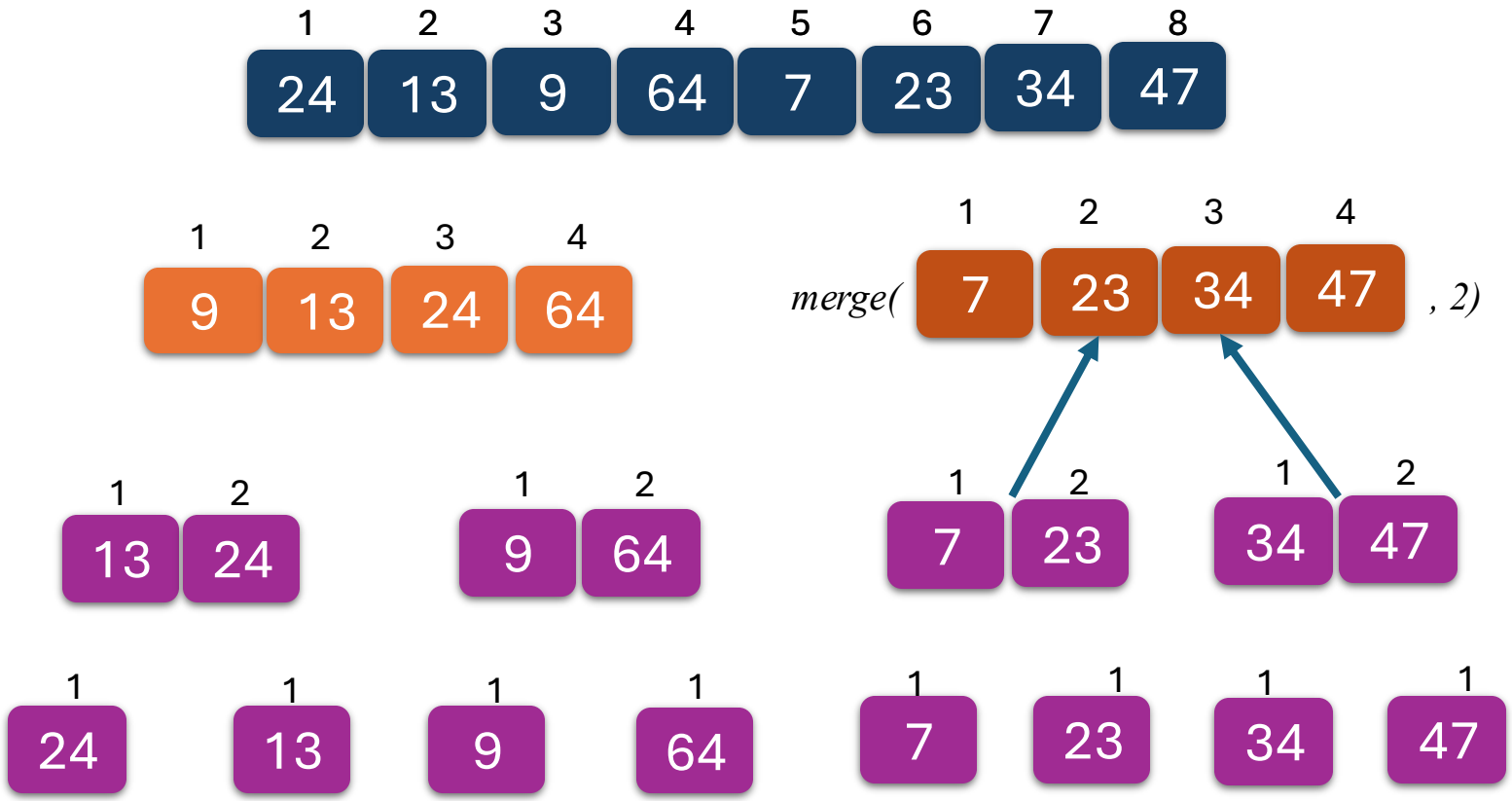
```



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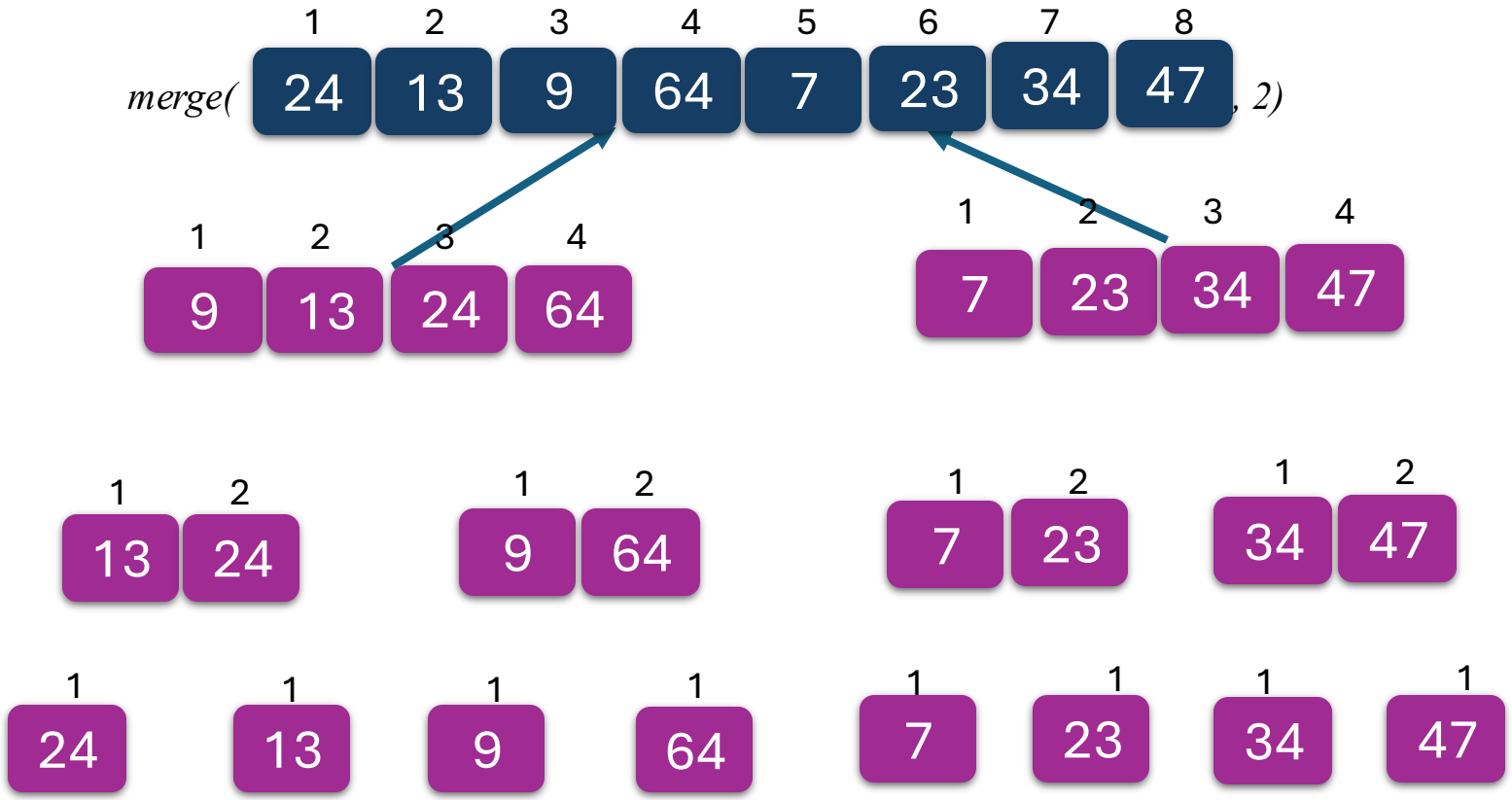

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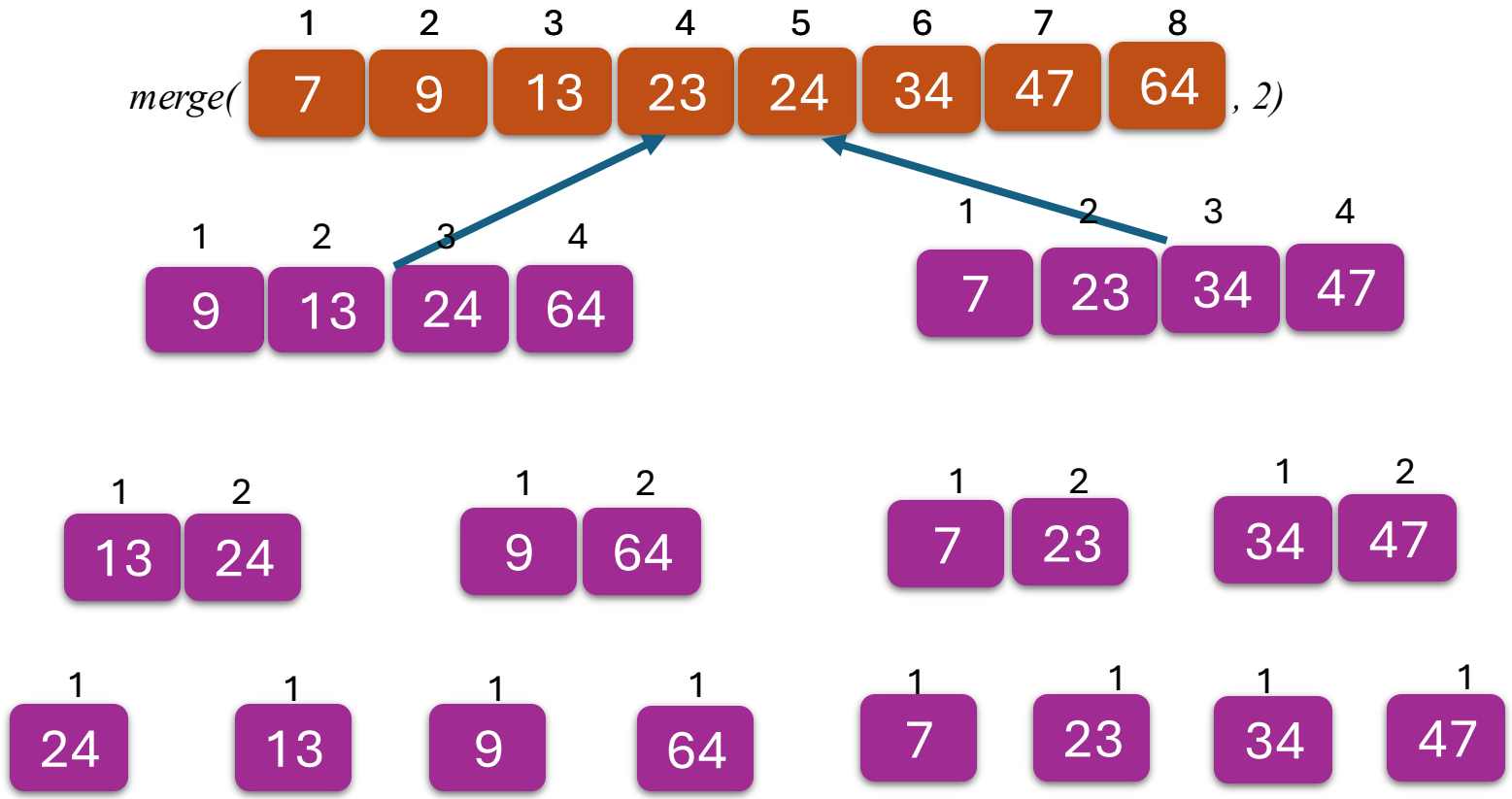

Let’s explore more the “merge” part

```
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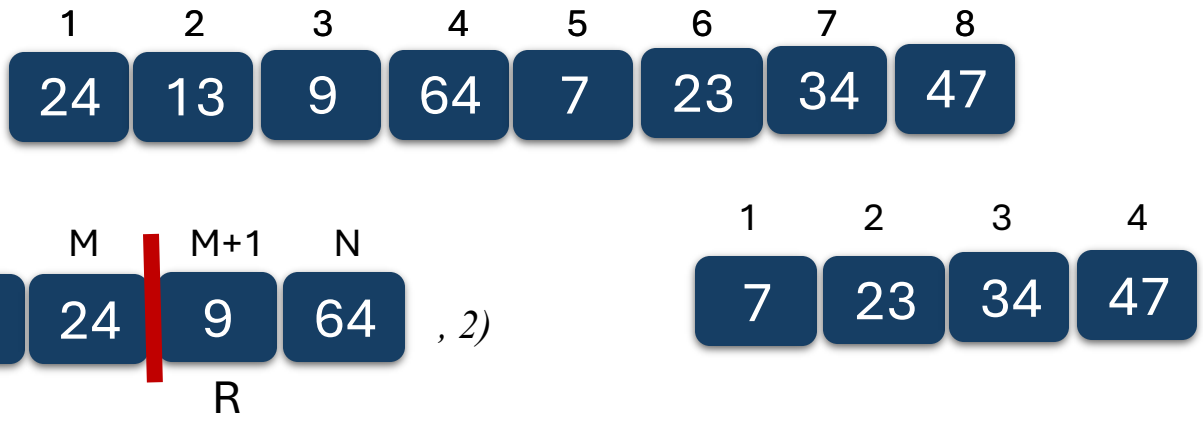
                B[i] = min(L, R)
        copy B to A
```

```
merge(array A, integer M):
        B = empty array of size N
        left = 1
        right= M + 1
        for i = 1 to N:
                if right > N:
                        B[ i ] = A[left]
                        left += 1
                else if left > M:
                        B[ i ] = A[right]
                        right += 1
                else if A[left] <    A[right]:
                        B[ i ] = A[left]
                        left += 1
                else if A[left] ≥ A[right]:
                        B[ i ] = A[right]
                        right += 1
                copy B to A
```



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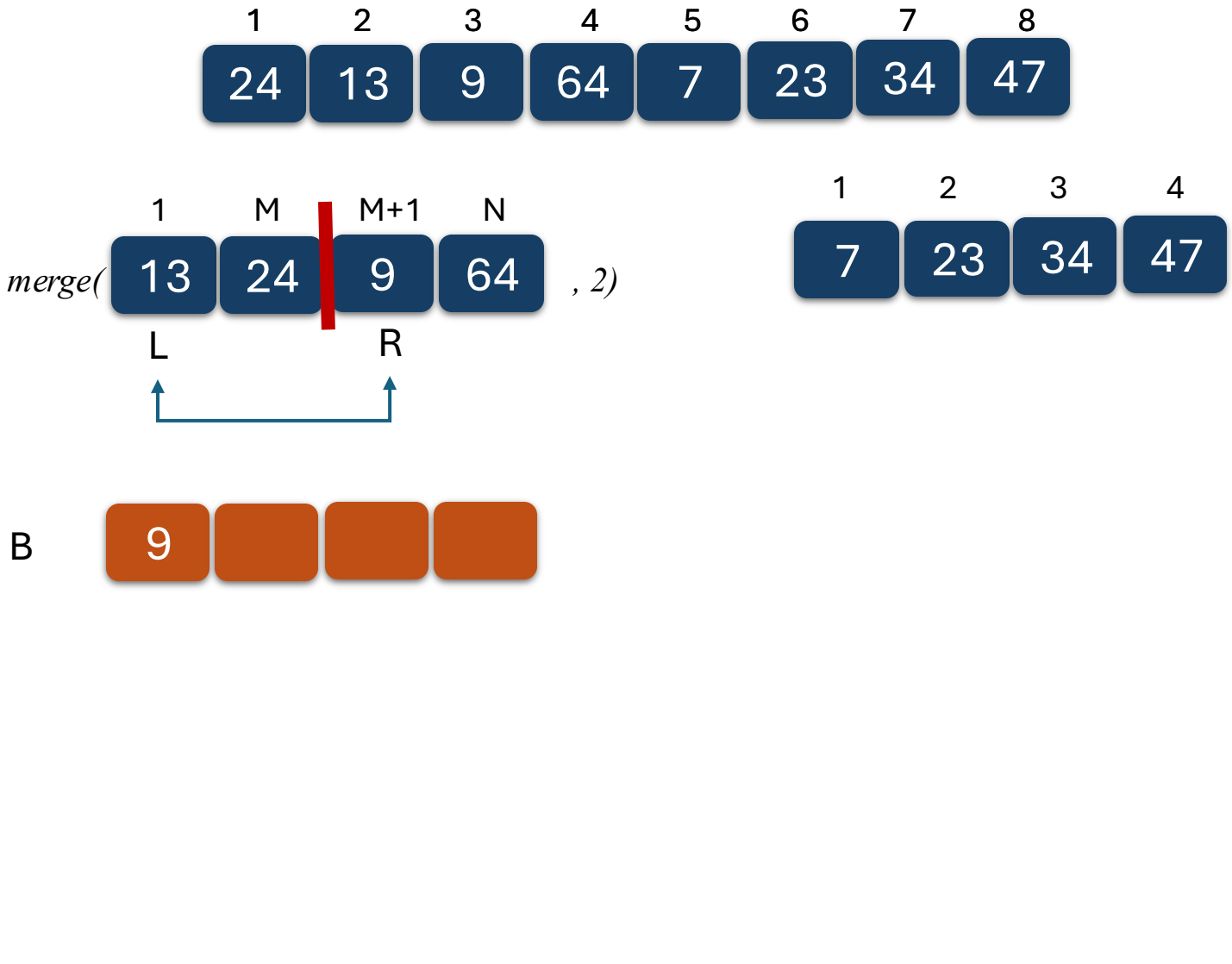

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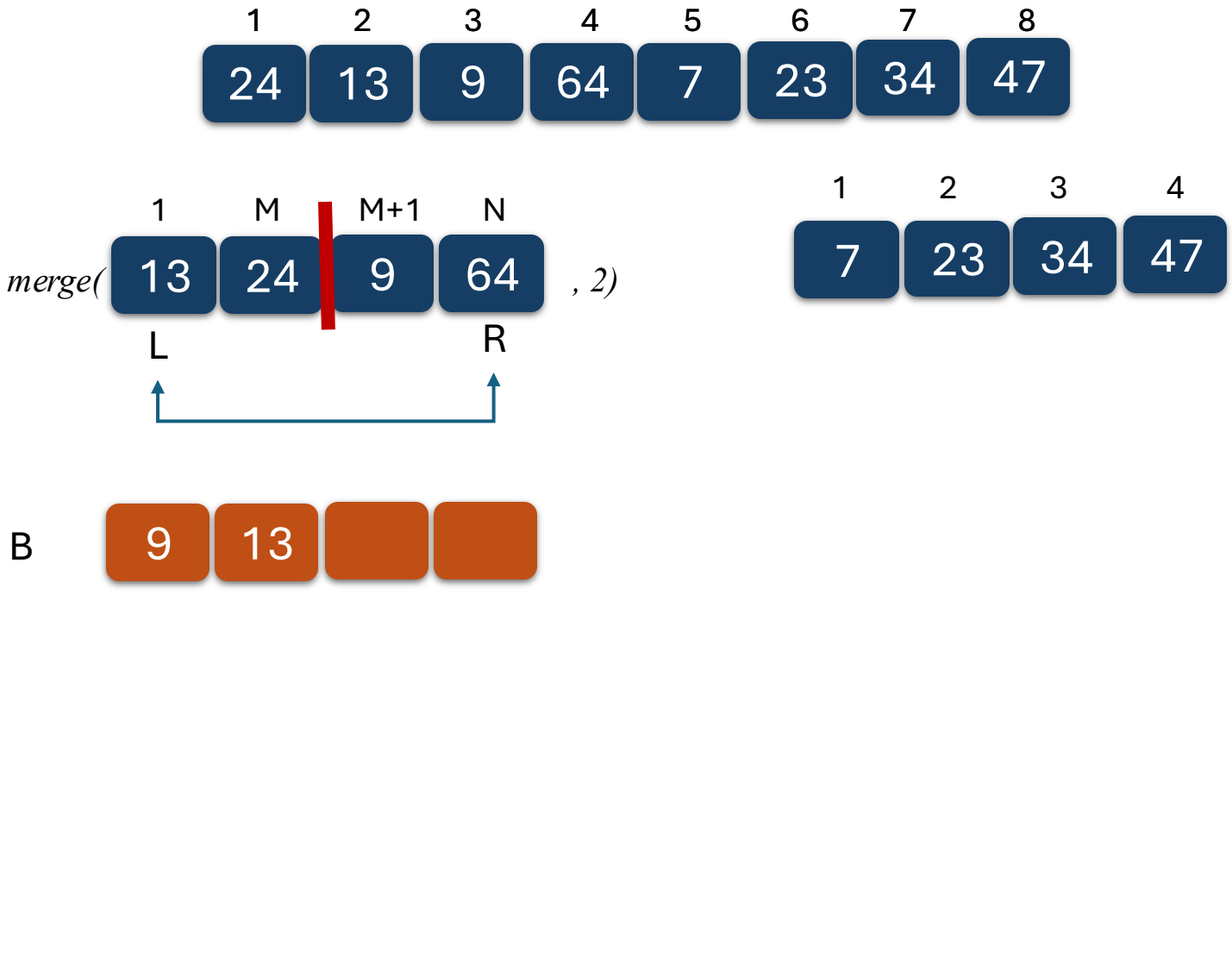

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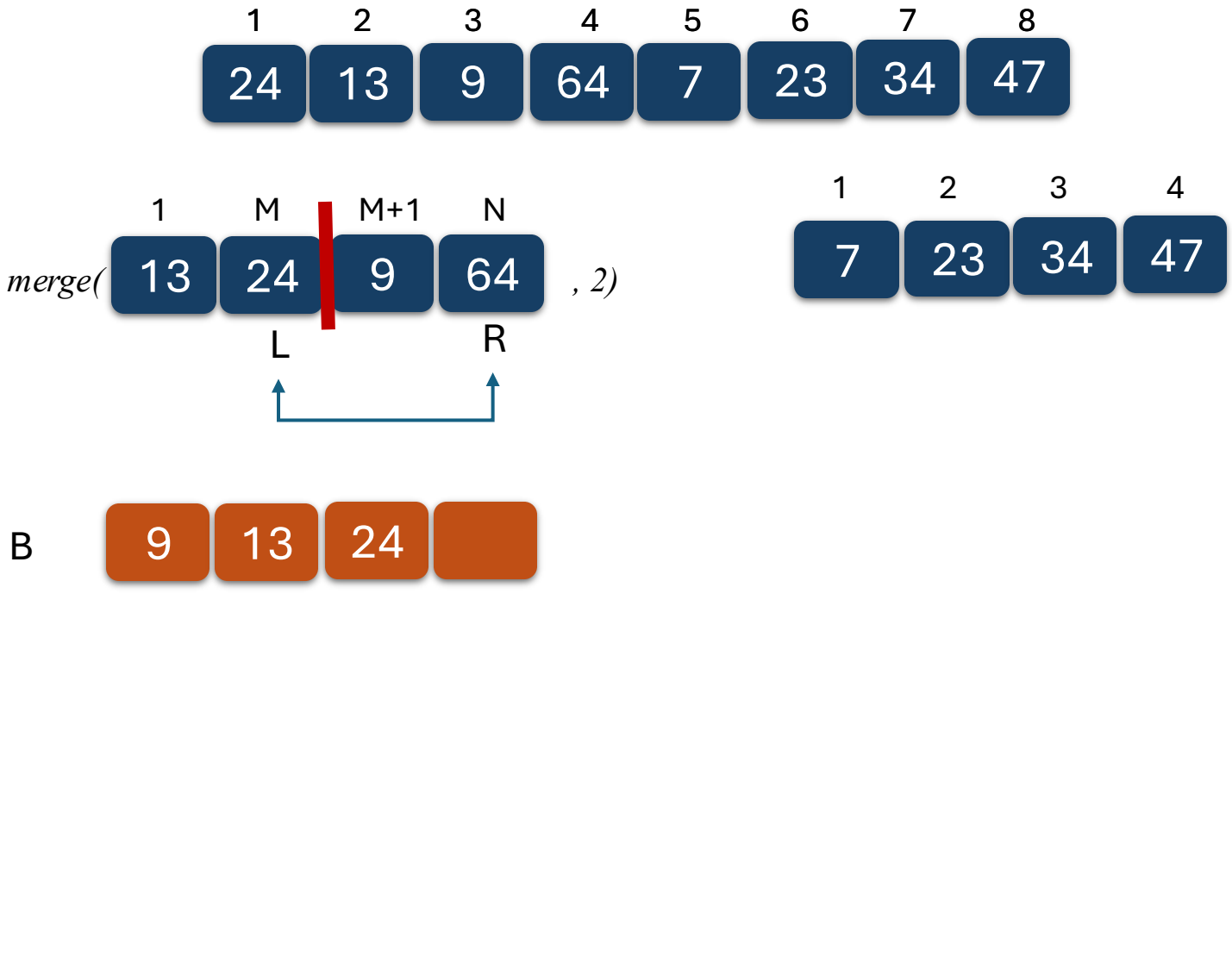

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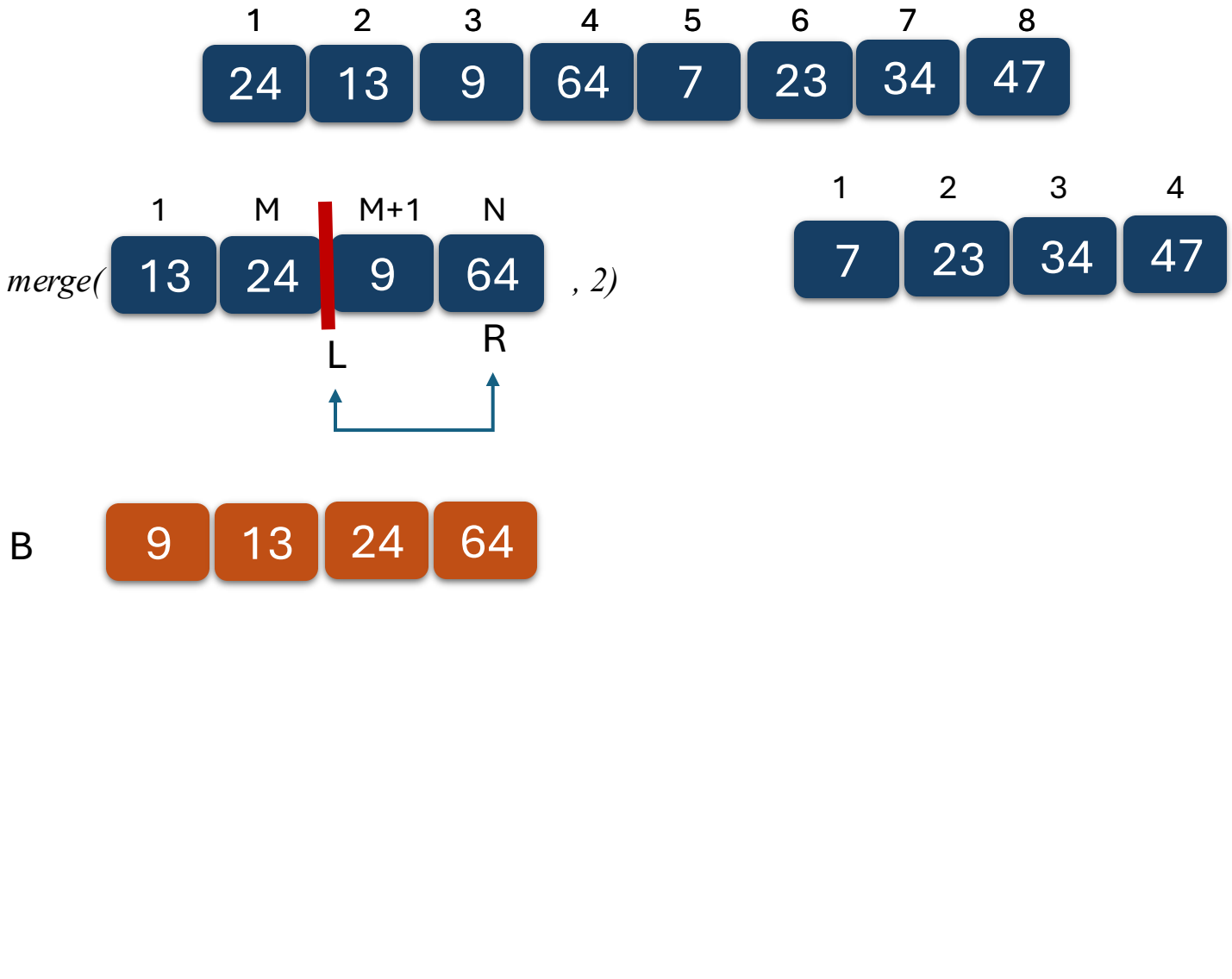

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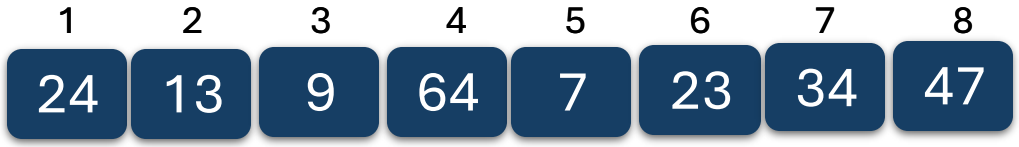

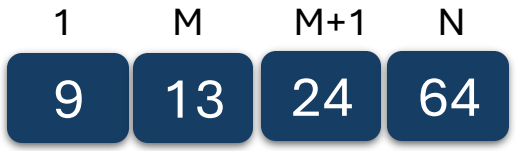

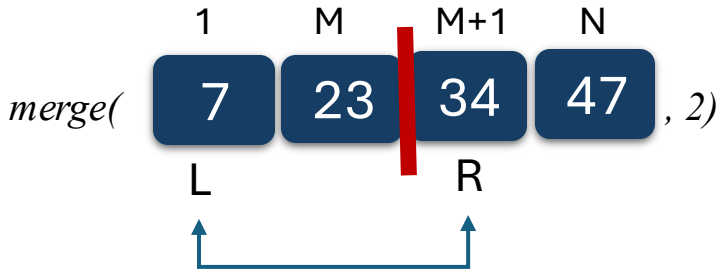

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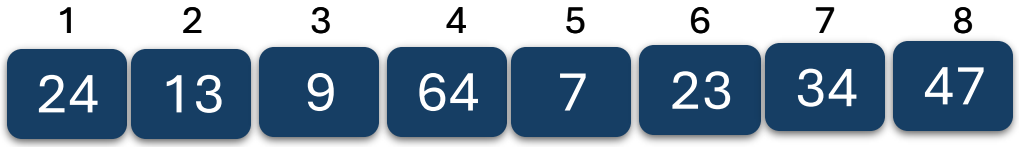

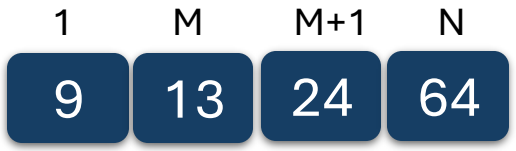

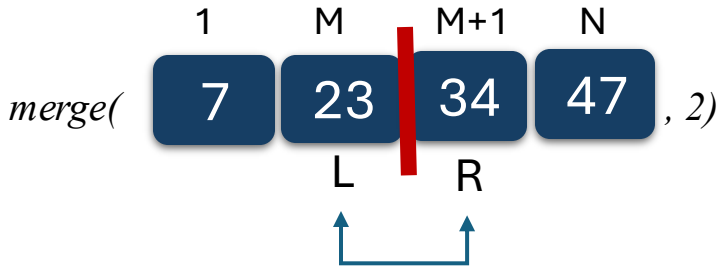

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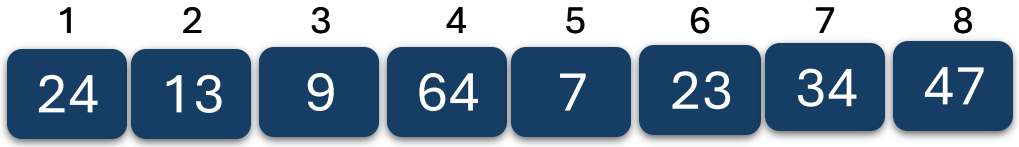

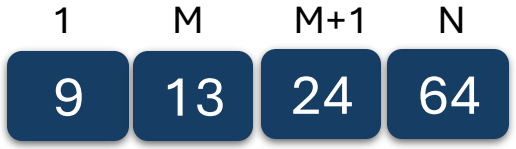

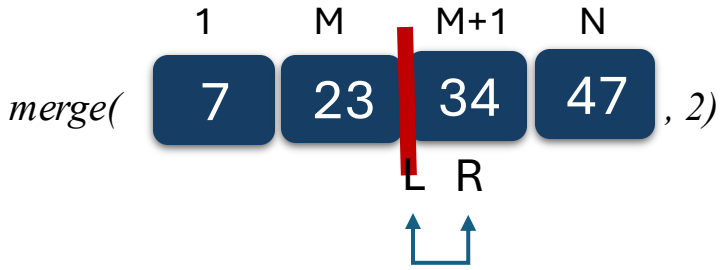

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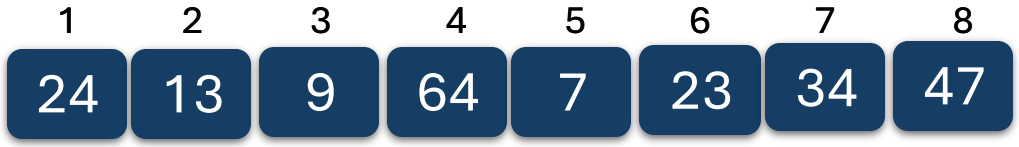

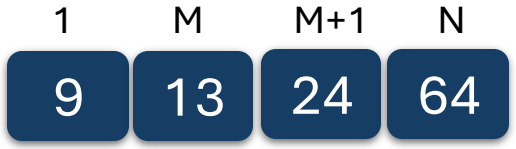

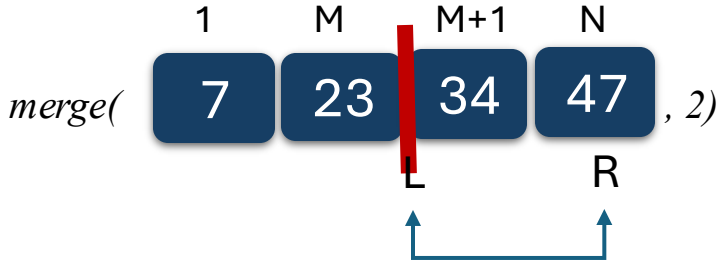

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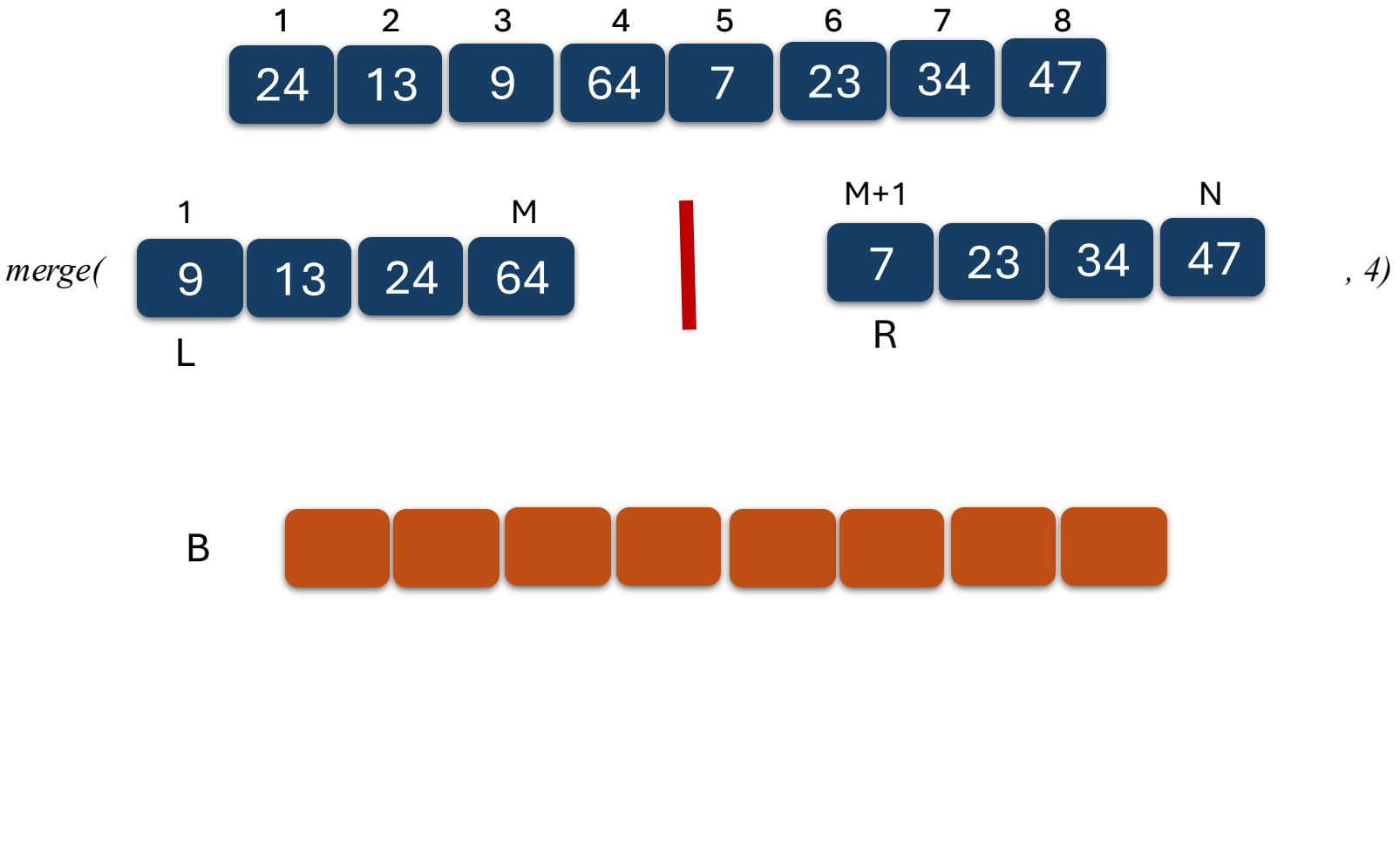

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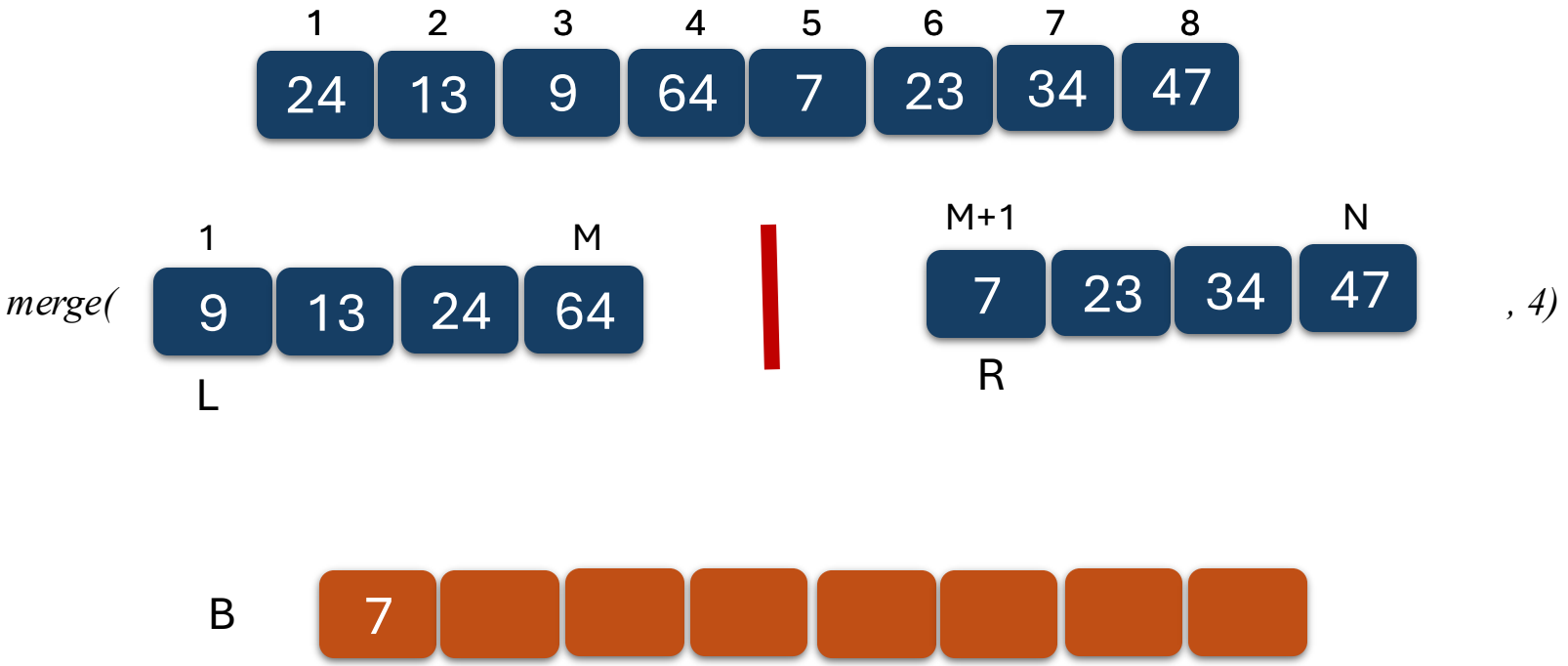

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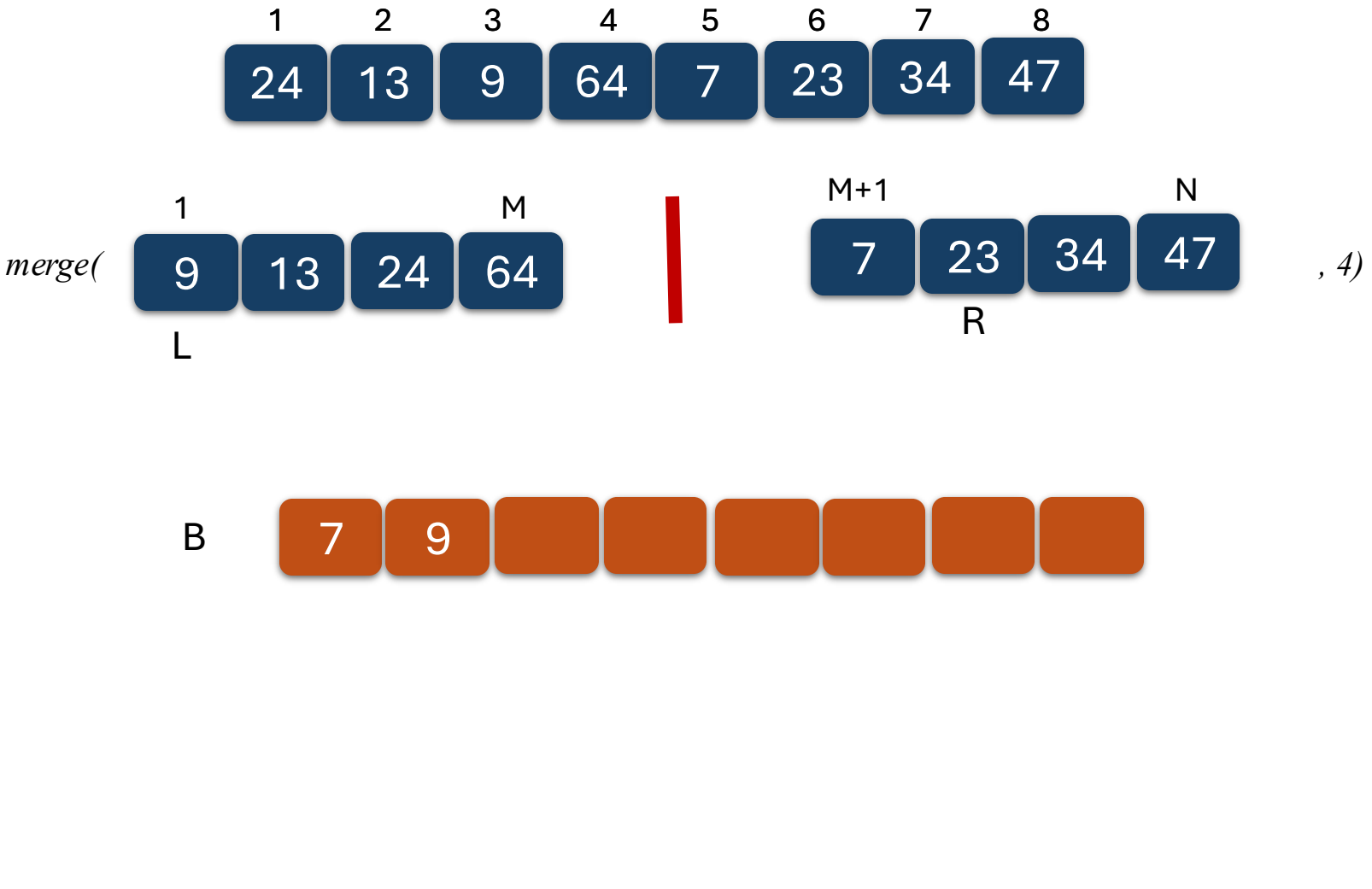

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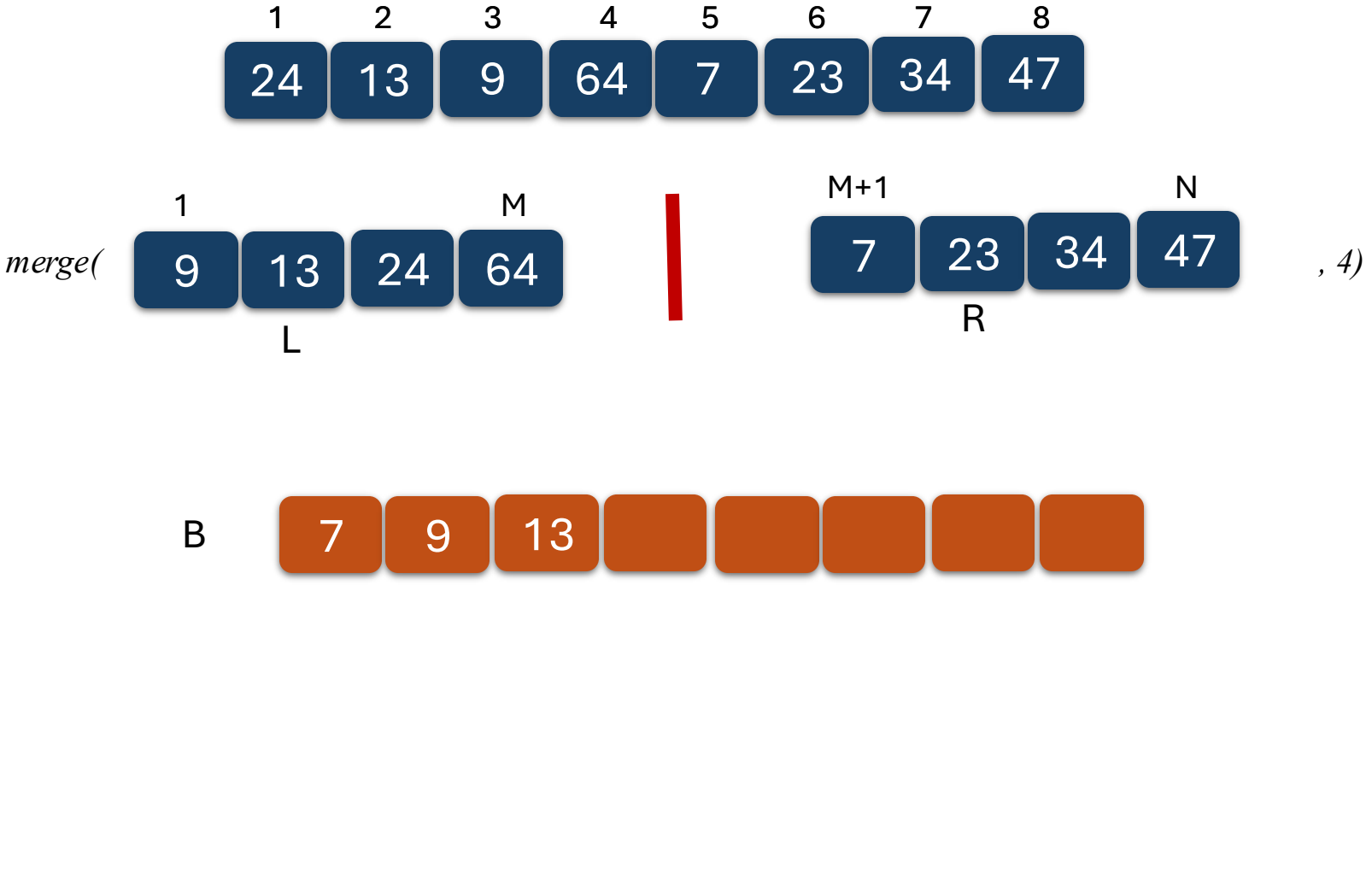

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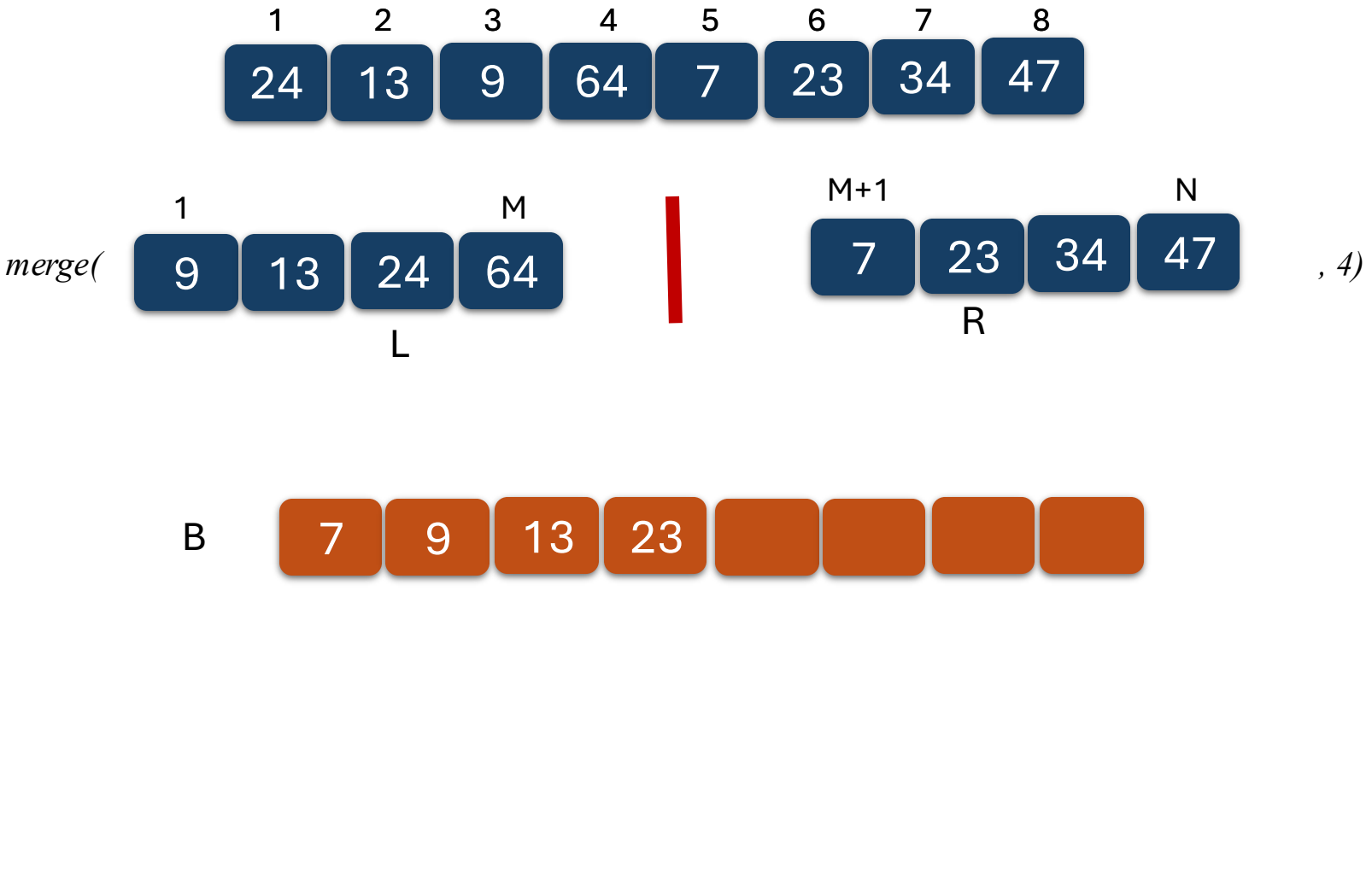

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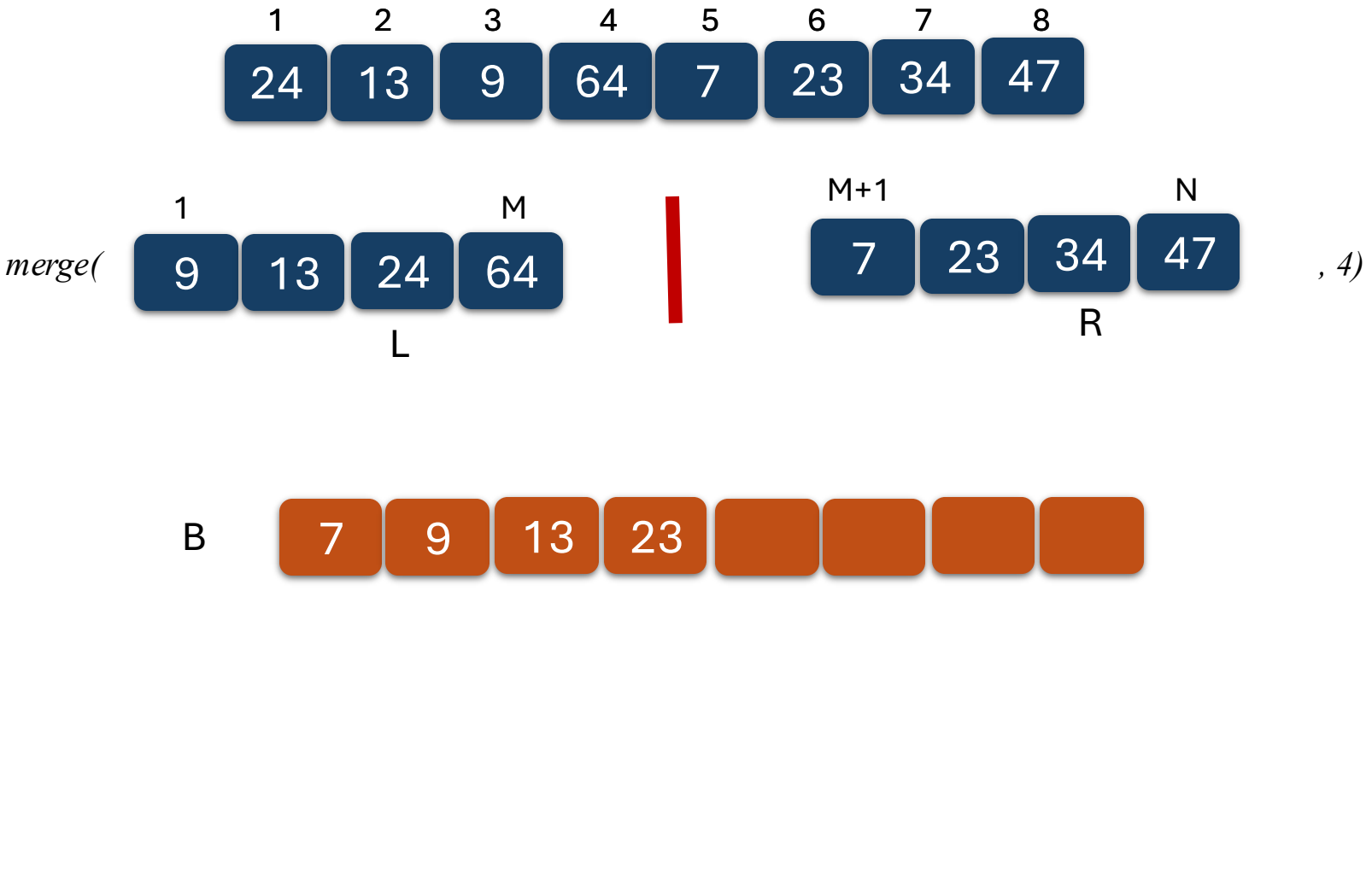

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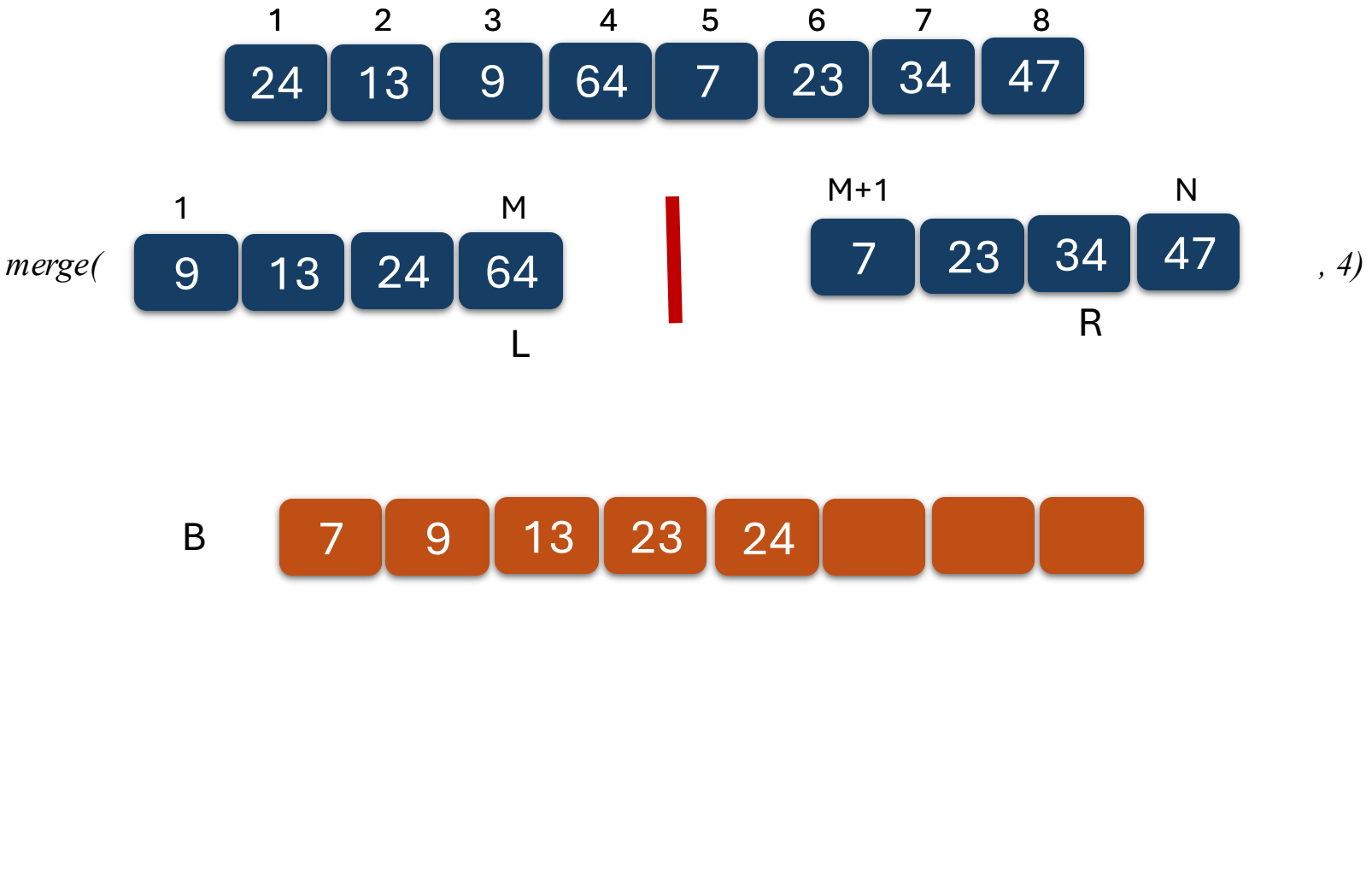

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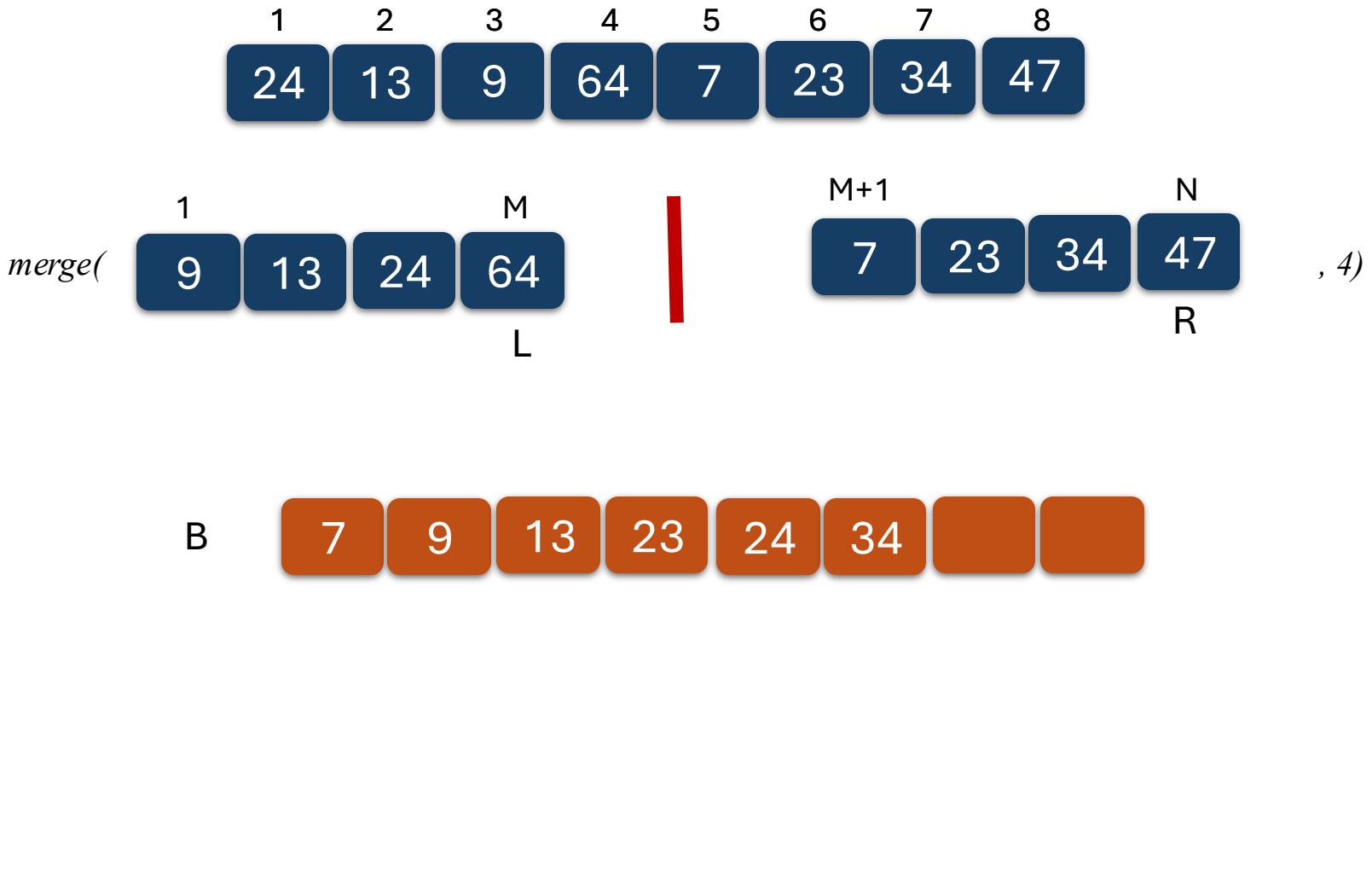

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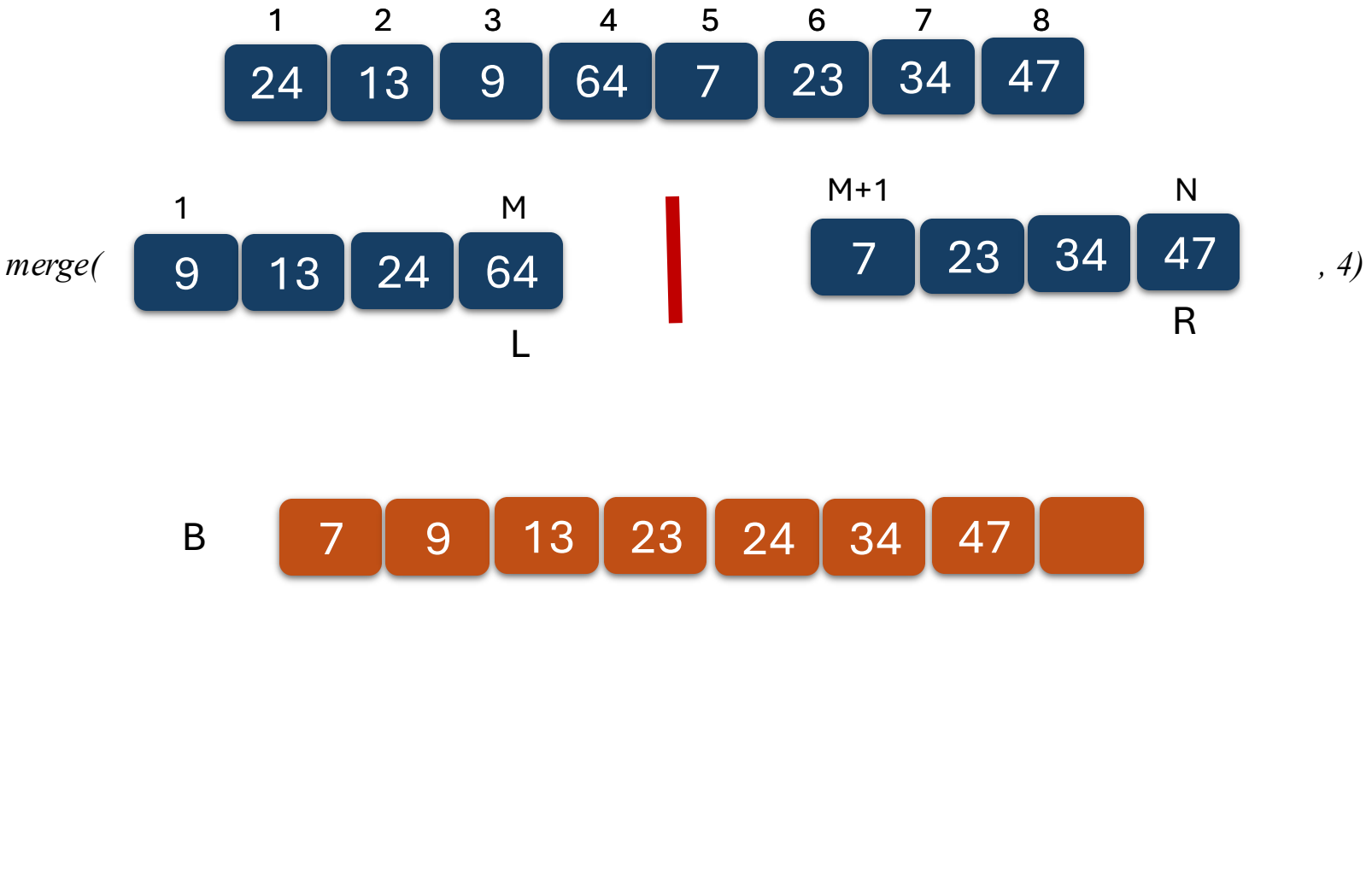

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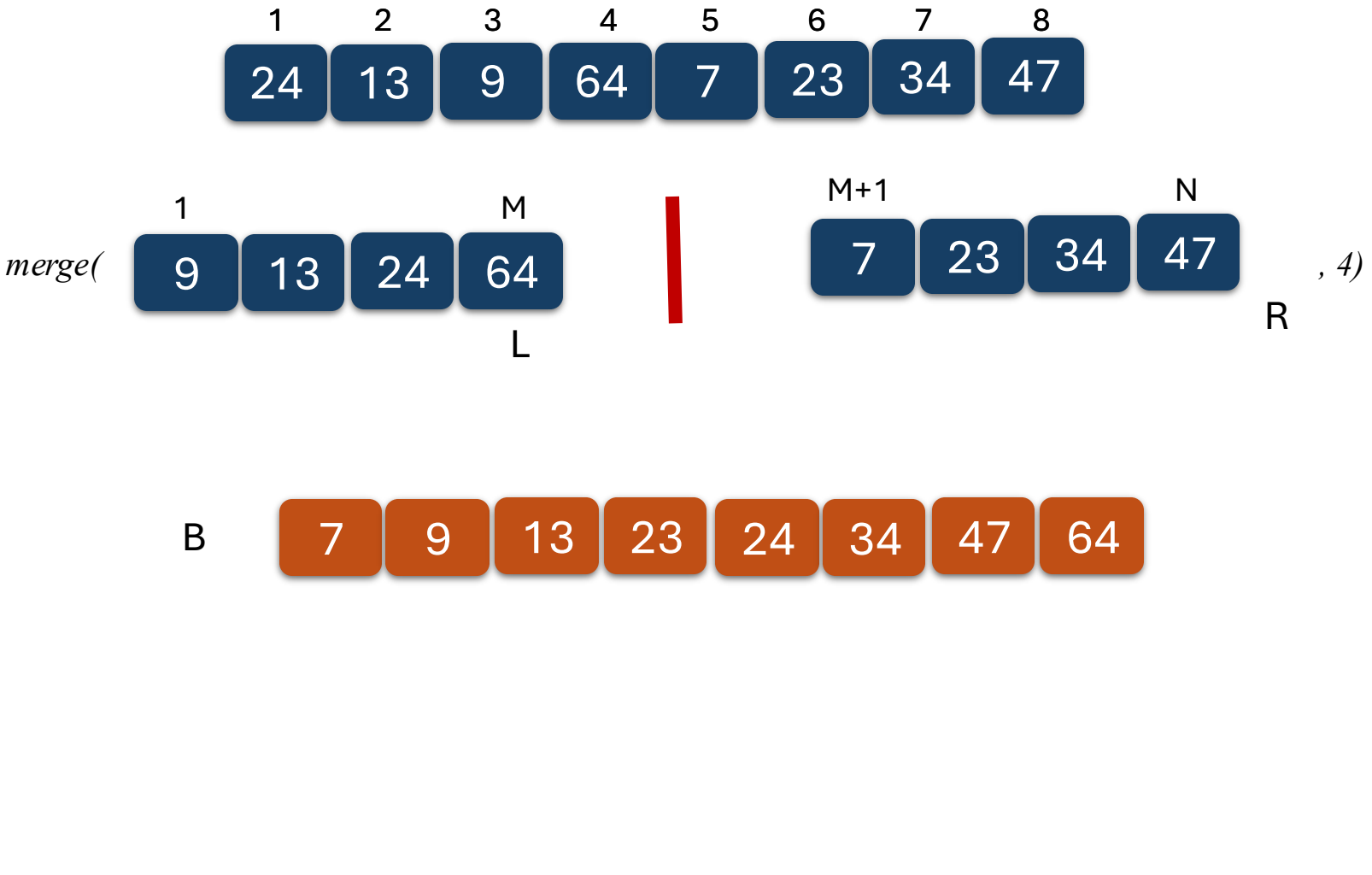
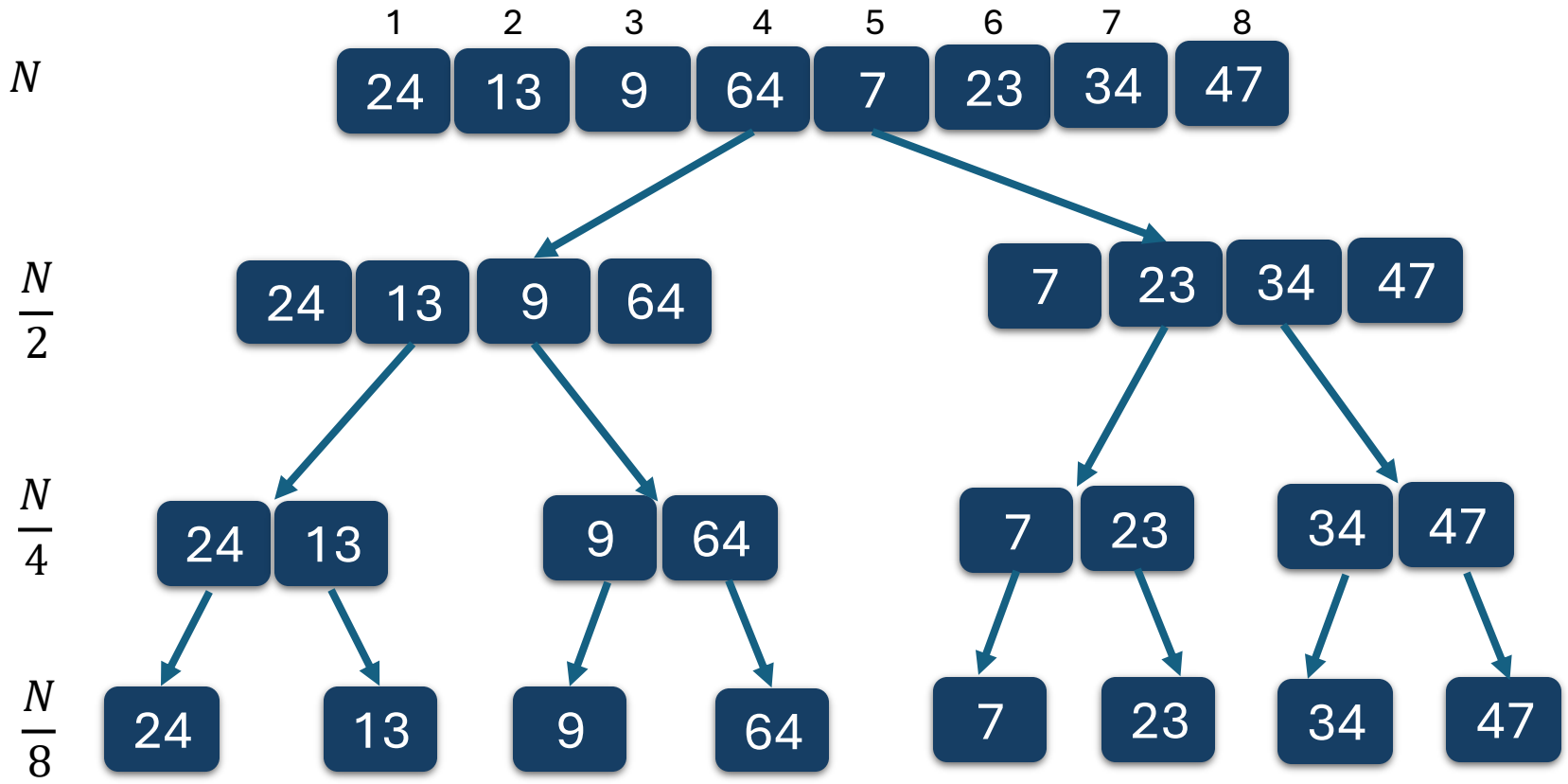


Merge Sort Complexity

```
merge_sort(array A):
    if N > 1:
        M = N / 2
        merge_sort(A[1 : M])
        merge_sort(A[M+1 : N])
        merge(A[1:N], M)
```



- Height of recursion tree = O($\log_2$ N), since we divide the problem in half during recursion
- There are O(log N) iterations / recursion levels
- In each level, we perform O(N) work during Merge since we are comparing the left and right solution's first items, at most N items.

```
merge(array A, integer M):
    left_half = A[1 : M]
    right_half = A[M+1 : N]
    for i = 1 to N:
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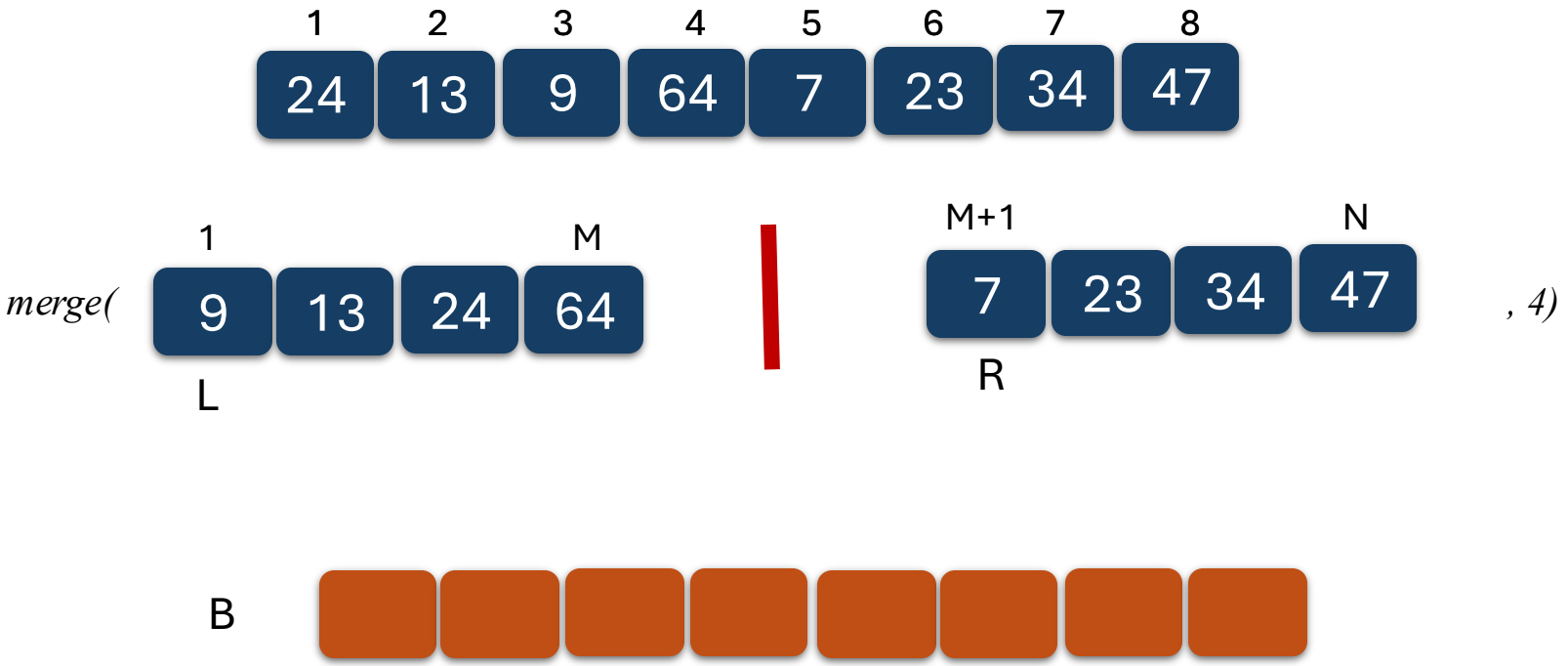
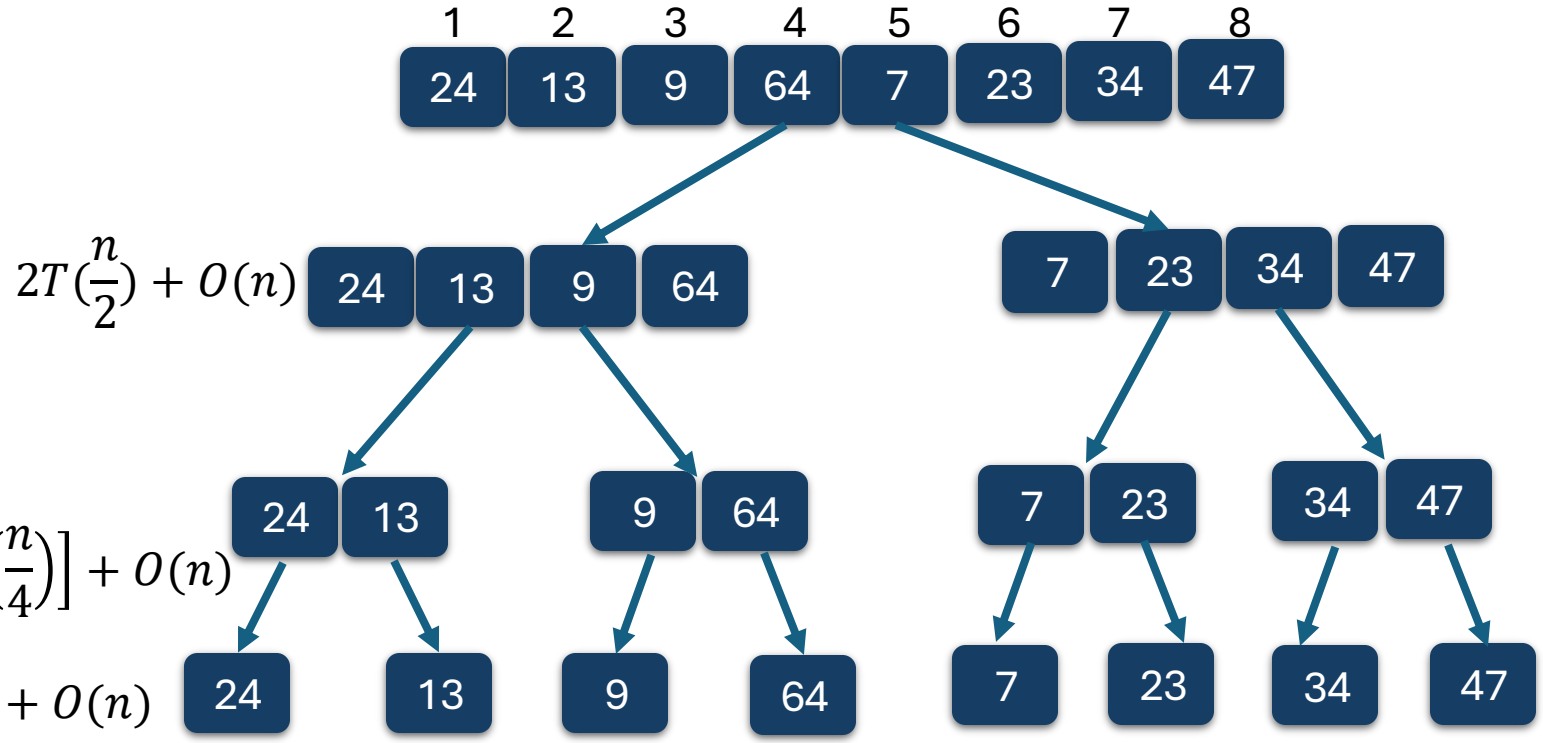
        else if A[left] <  A[right]:
            B[ i ] = A[left]
            left += 1
        else if A[left] ≥ A[right]:
            B[ i ] = A[right]
            right += 1
        copy B to A
```



- Height of recursion tree = $O(\log_2 N)$, since we divide the problem in half during recursion
- There are O(log N) iterations / recursion levels
- In each level, we perform O(N) work during Merge since we are comparing the left and right solution's first items, at most N items.

```
merge_sort(array A):
    if N > 1:                          O(1)
        M = N / 2
        merge_sort(A[1 : M])           T(N/2)
        merge_sort(A[M+1 : N])         T(N/2)
        merge(A[1:N], M)               O(n)
```



$n[T(1)] + O(n)$

$= O(nlogn)$

```
merge_sort(array A):
    if N > 1:                          O(1)
        M = N / 2
        merge_sort(A[1 : M])           T(N/2)
        merge_sort(A[M+1 : N])         T(N/2)
        merge(A[1:N], M)               O(n)
```

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

$$T\left(\frac{n}{2}\right) = 2T\left(\frac{n}{4}\right) + \frac{n}{2}$$

$$T\left(\frac{n}{4}\right) = 2T\left(\frac{n}{8}\right) + \frac{n}{4}$$

$$\cdots$$

$$T(1) = 2T\left(\frac{n}{n}\right) + n$$

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

$$T(n) = 2\left[2T\left(\frac{n}{4}\right) + \frac{n}{2}\right] + n$$

$$T(n) = 4T\left(\frac{n}{4}\right) + n + n$$

$$T(n) = 4\left[2T\left(\frac{n}{8}\right) + \frac{n}{4}\right] + 2n$$

$$T(n) = \left(8T\left(\frac{n}{8}\right) + n\right) + 2n$$

$$T(n) = 2^k T\left(\frac{n}{2^k}\right) + kn$$

$$\cdots$$

$$T(n) = 2^k T\left(\frac{2^k}{2^k}\right) + kn$$

$$T(n) = 2^k T(1) + kn$$

Stops until T(1) or if the array size=1 or if $\frac{N}{2^k} = 1$

Now, if $n = 2^k$

$$n = 2^k$$

$$k = \log_2 n$$

```
merge_sort(array A):
    if N > 1:                          O(1)
        M = N / 2
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        merge(A[1:N], M)               O(n)
```

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        merge(A[1:N], M)               O(n)
```

$$Merge\ Sort = 2^k T\left(\frac{N}{2^k}\right) + k * O(n)$$

Stops until T(1) or if the array size=1 or if $\frac{N}{2^k} = 1$

$$\frac{N}{2^k} = 1$$

$$N = 2^k$$

$$\log_2 N = \log_2 2^k$$

$$\log_2 N = k$$

...

$$Merge\ Sort = 2^k T\left(\frac{N}{2^k}\right) + k * O(n)$$

$$Merge\ Sort = n * T(1) + logn * O(n)$$

$$Merge\ Sort = n + logn * O(n) = O(nlogn)$$

Next meeting….

We’ll discuss more sorting algorithms.