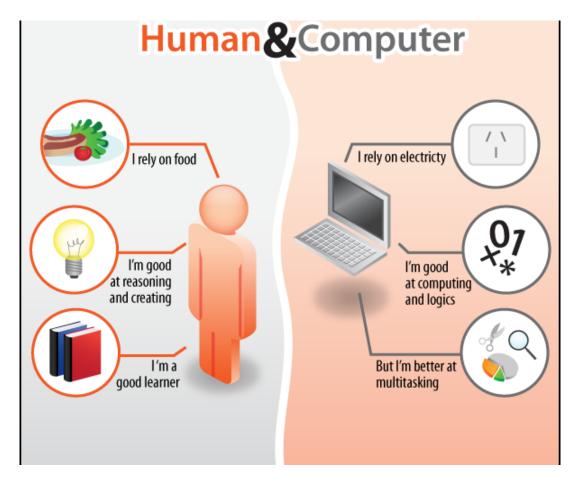
# **CIS 606 Analysis of Algorithms**

Introduction





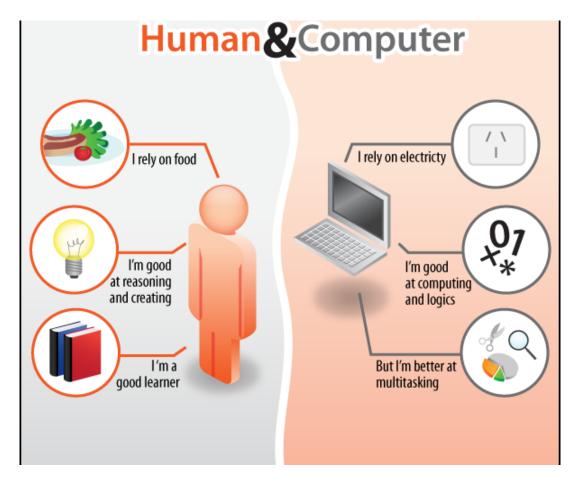
# **Human vs Computer**





reference: http://www.differencebetween.net/human-vs-computer/

# **Human vs Computer**

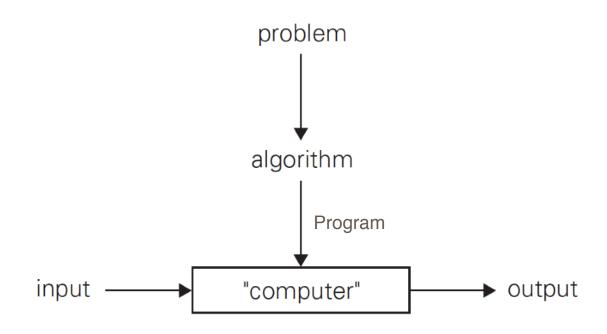




reference: http://www.differencebetween.net/human-vs-computer/

# What Is An Algorithm?

 An algorithm is a sequence of unambiguous instructions for solving a problem, i.e., for obtaining a required output for any legitimate input in a finite amount of time.





# **Computing Environment**

- The random-access machine (RAM)
  - A single CPU with a fixed number of registers each with w bits.
    - No concurrent operations
    - Algorithm executed on RAM is called Sequential Algorithm.
  - An infinite sequence of cells for memory: each cell contains w bits.
    - Memory access takes one time step, and there is no shortage of memory.
  - Each atomic operation takes 1 time step.



## **Atomic Operations on RAM**

- Set a register a to a value: a=10.
- An arithmetic operation
  - a+b, a-b, a\*b, a/b(integer division: 6/3=2, 7/3=2)
- A comparison/branching operation
  - a<b, a=b, a>b
- A memory access
  - Read the memory cell at address A into a register
  - Write the value of a register into the memory cell at address A



## Algorithm for Computing the Sum

```
Sum(Array A : list of integers)
{
    n = A.size
    sumA = 0
    for i = 1 to n
        sumA = sumA + A[i]
    return sumA
}
```

The cost of an algorithm:
Time Complexity and Space Complexity



An algorithm is the step-by-step procedure (i.e., a sequence of atomic operations) to compute the solution.

### **Time and Space**

- Time complexity: How long does an algorithm take to compute the solution?
  - For any given problem the running time of an algorithms is the number of time steps, i.e., the number of atomic operations.
- Space complexity: How much memory an algorithm use in its execution?
  - The space used by an algorithm is assumed to be the number of RAM memory cells.



# What is a good Algorithm?

- Two standards:
  - Correctness
  - Use less resources: time and space



# Methods of Specifying an Algorithm

- Natural Language
- Pseudocode
- Flowchart
- Computer Program



# **Computing Time Complexity of an Algorithm**

Run the code on computer with different input and time it.

```
Sum(Array A : list of integers)
{
    n = A.size
    sumA = 0
    for i = 1 to n
        sumA = sumA + A[i]
    return sumA
}
```



## **Computing Time Complexity of an Algorithm(cont)**

Analyze the time on the paper

```
Sum(Array A : list of integers)
{
    n = A.size
    sumA = 0
    for i = 1 to n
        sumA = sumA + A[i]
    return sumA
}
```

What is the running time?



# **Time Complexity T(n)**

- The time complexity of an algorithm is a function with respect to the input size n.
- Constant time: O(1)
  - T(n) = 4, T(n)=10000000
- Linear: O(n)
  - T(n) = 300n+1, T(n) = 1024n+100000000
- Quadratic: O(n<sup>2</sup>)
  - $T(n) = 2n^2+1$ ,  $T(n) = 1024n^2+20$

Exponential:O(2n)

$$T(n) = 2^n$$

# **How Do We Measure the Running Time?**

- Depends on the input size n
  - n=6, n= 6000, n=6\*10<sup>6</sup>
- Depends on the input pattern
  - Worst case
  - Best case
  - Average case
- Depends on the machine
  - Super computer, phone



## **Example: Sorting Problem - Bubble Sort**

- Input: a sequence of numbers {71, 32, 65, 4, 45, 67, 20} in an array A
- Output: the ascending order of A = {4, 20, 32, 45, 65, 67, 71}
- Algorithm: Bubble Sort
  - Repeat to step through the list
  - Every pass, compare adjacent elements and swap them if they are out of order
  - End until no swaps are needed

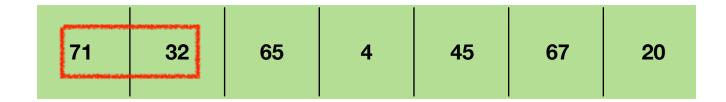


Sort the following array from lowest number to greatest number

71	32	65	4	45	67	20
----	----	----	---	----	----	----



Sort the following array from lowest number to greatest number





### Sort the following array from lowest number to greatest number

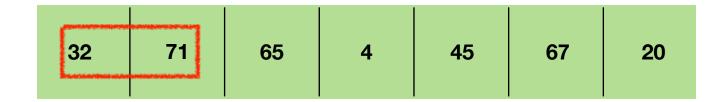
#### **First Pass:**





### Sort the following array from lowest number to greatest number

#### **First Pass:**





Sort the following array from lowest number to greatest number

	- Commonweal Common Com	e-merrorang				
32	71	65	4	45	67	20
	- Incommonwe					



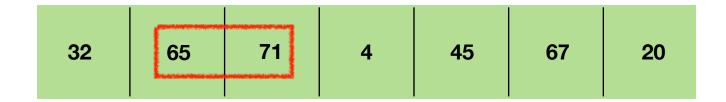
### Sort the following array from lowest number to greatest number



71>65



### Sort the following array from lowest number to greatest number



71>65

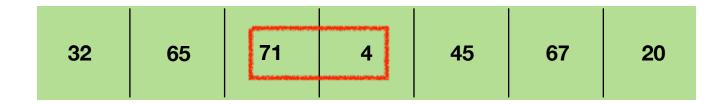


Sort the following array from lowest number to greatest number

		-				
32	65	71	4	45	67	20
		Brownwater				



### Sort the following array from lowest number to greatest number

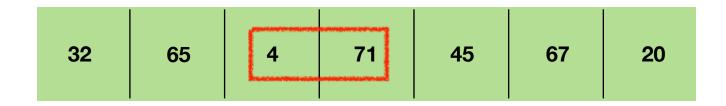


71>4



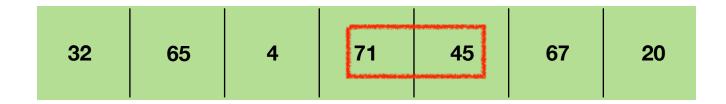
### Sort the following array from lowest number to greatest number

#### **First Pass:**





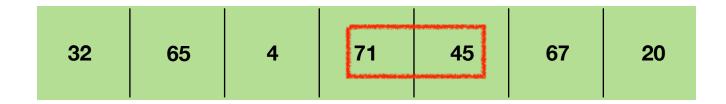
Sort the following array from lowest number to greatest number





Sort the following array from lowest number to greatest number

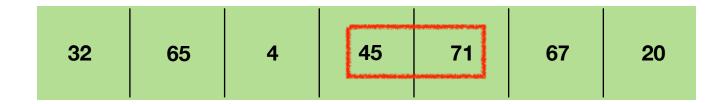
#### **First Pass:**





Sort the following array from lowest number to greatest number

#### **First Pass:**





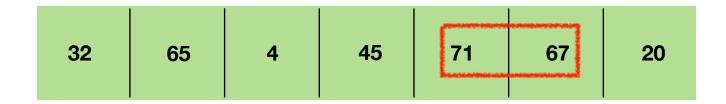
Sort the following array from lowest number to greatest number

				· ·	emmentary and	
32	65	4	45	71	67	20
				-	anne anne anne	



### Sort the following array from lowest number to greatest number

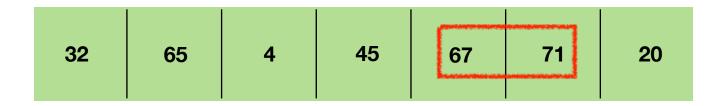
#### **First Pass:**





### Sort the following array from lowest number to greatest number

#### **First Pass:**





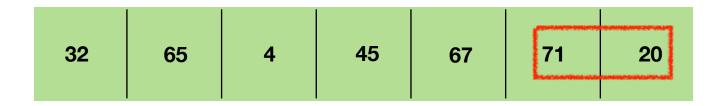
Sort the following array from lowest number to greatest number

					-		
32	65	4	45	67	71	20	
					- Recommunican	***************************************	



Sort the following array from lowest number to greatest number

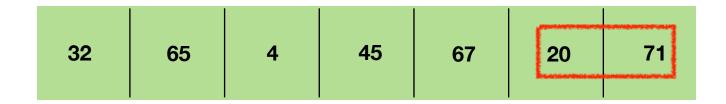
#### **First Pass:**





### Sort the following array from lowest number to greatest number

#### **First Pass:**





Sort the following array from lowest number to greatest number

32	65	4	45	67	20	71
----	----	---	----	----	----	----



Sort the following array from lowest number to greatest number

**First Pass:** 

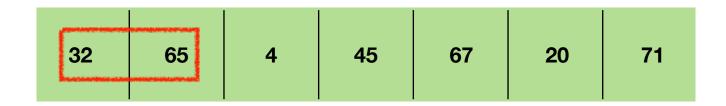
32	65	4	45	67	20	71
----	----	---	----	----	----	----



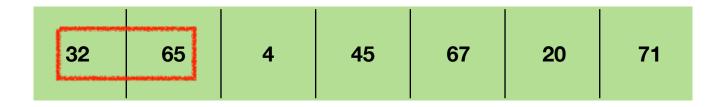
Swaps occurred in the first pass —> next pass

32	65	4	45	67	20	71
----	----	---	----	----	----	----



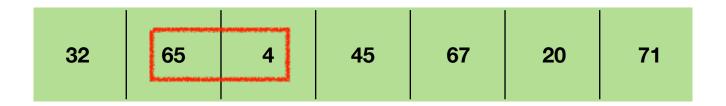






32<65





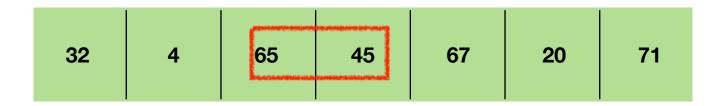




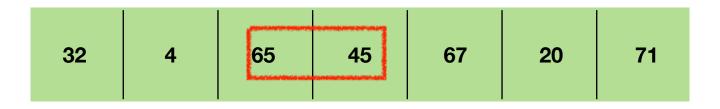




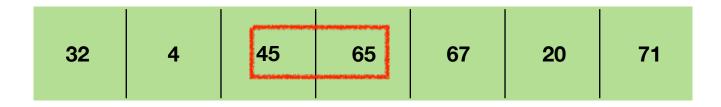




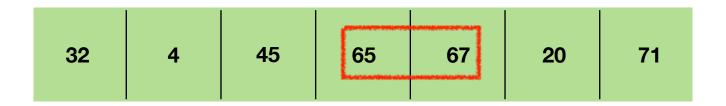




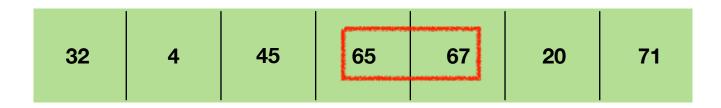






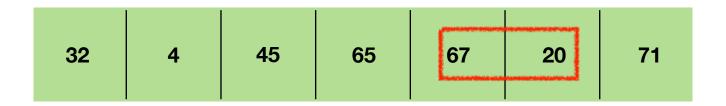




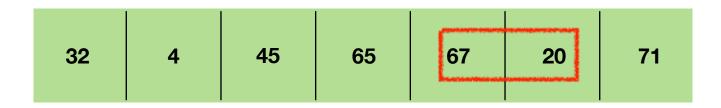


65<67

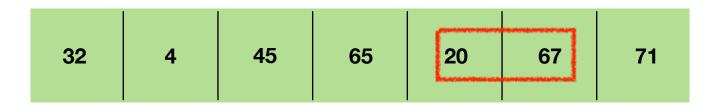




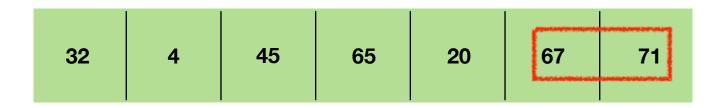










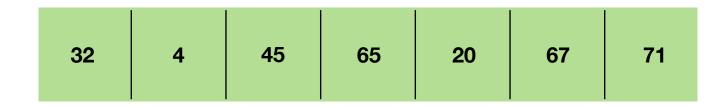


67<71



32 4 45 65 20 67
------------------



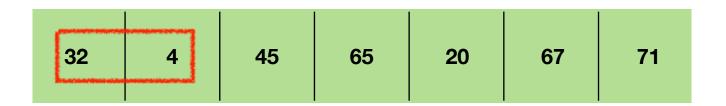


Swaps occurred in the second pass —> next pass

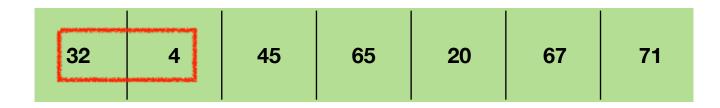


32	4 45	65	20	67	71
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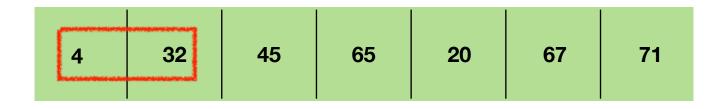




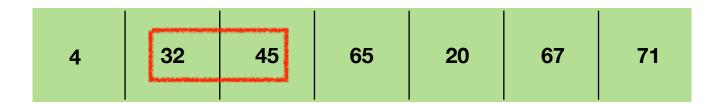




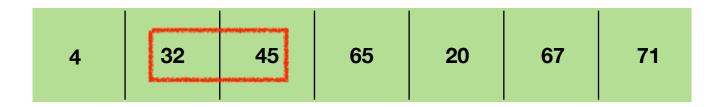






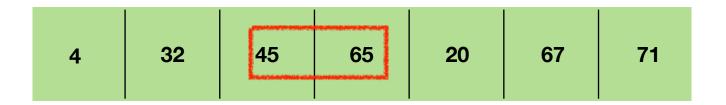




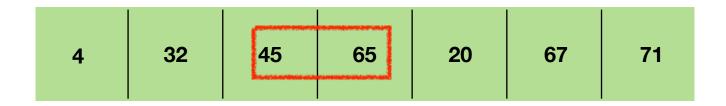


32<45



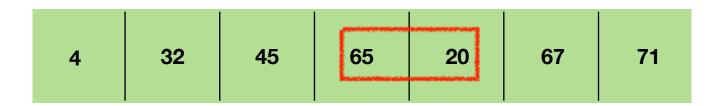




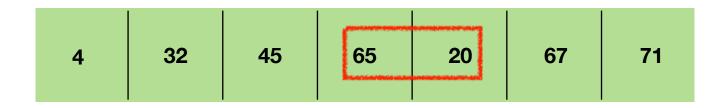


45<65

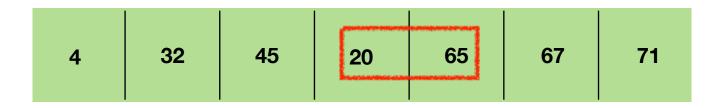




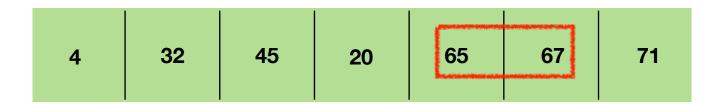




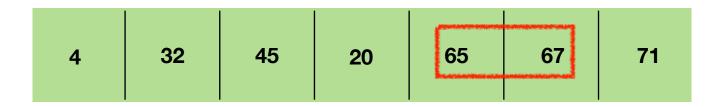










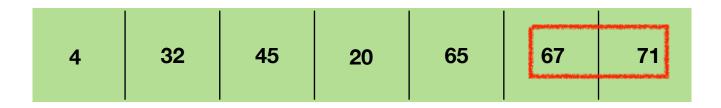


65<67



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4	32	45	20	65	67	71	
					Becassionessons	- Susanususanan	



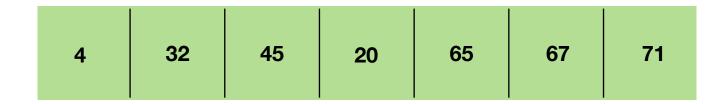


67<71



4	32	45	20	65	67	71	
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Swaps occurred in the third pass —> next pass

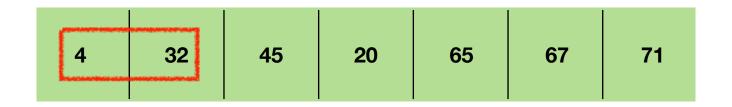


# **Bubble Sort - Fourth Pass**

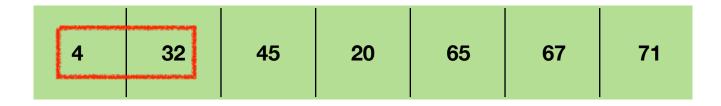
4	32	45	20	65	67	71
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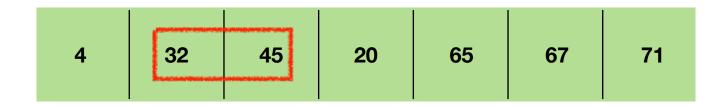
# **Bubble Sort - Fourth Pass**



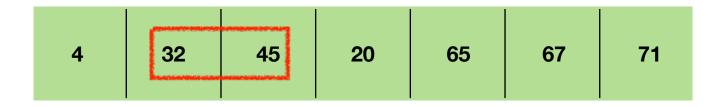




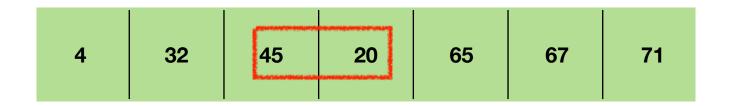




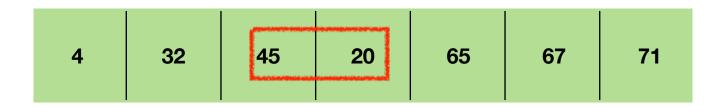






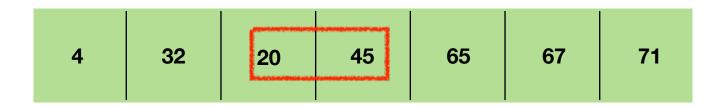






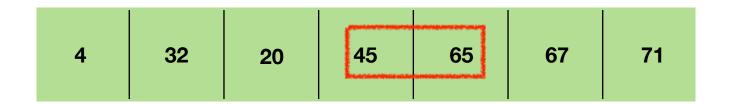
45>20



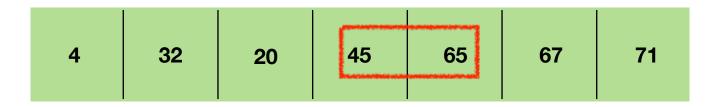


45>20

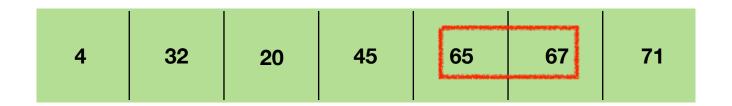




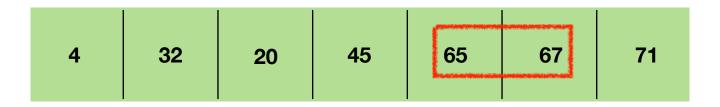




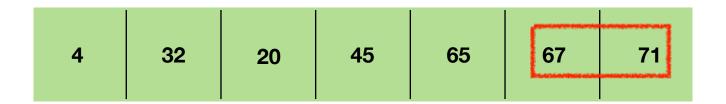




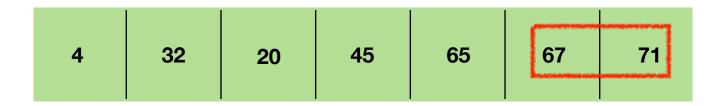








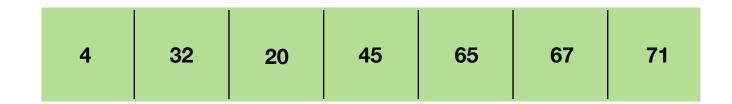






4	32	20	45	65	67	71
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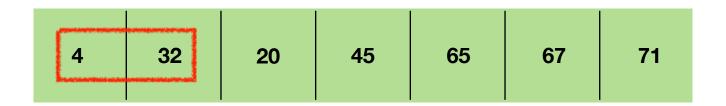


Swaps occurred in the fourth pass —> next pass

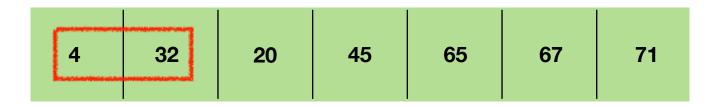


4	32 20	45	65	67	71
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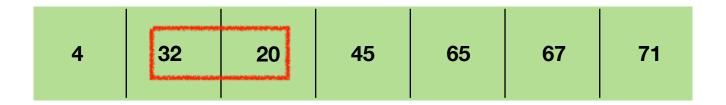




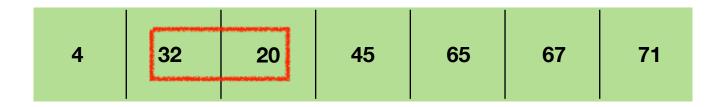






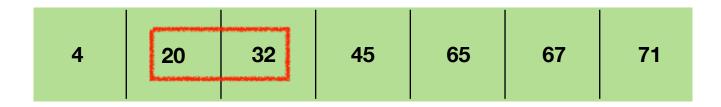






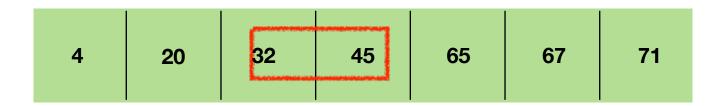
32>20



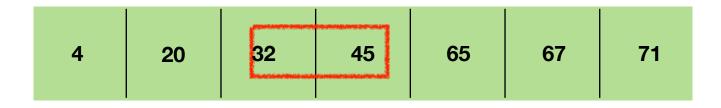


32>20

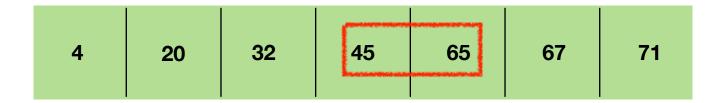




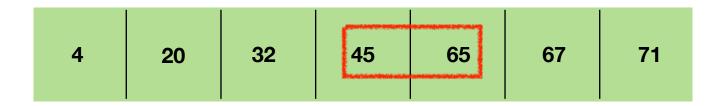








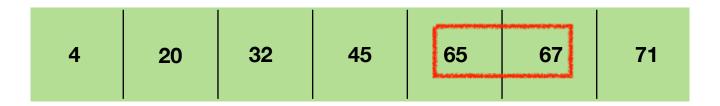








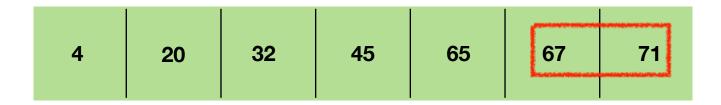








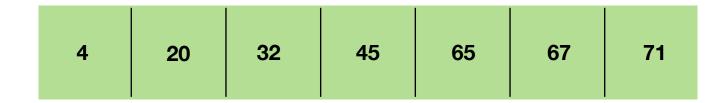






4	20	32	45	65	67	71
---	----	----	----	----	----	----



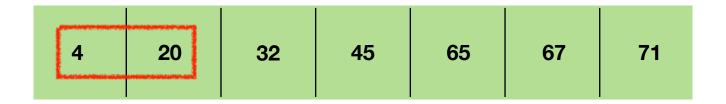


Swaps occurred in the fifth pass —> next pass

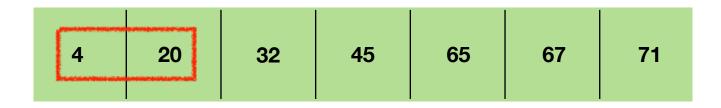


4	20	32	45	65	67	71
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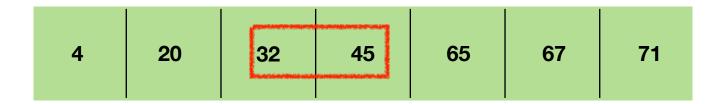




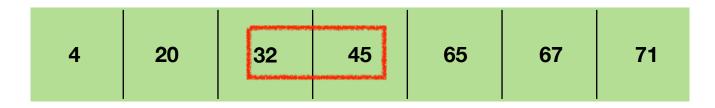






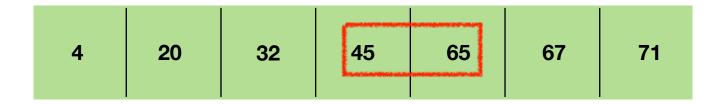




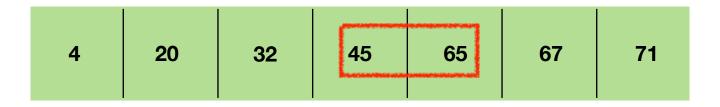


32<45







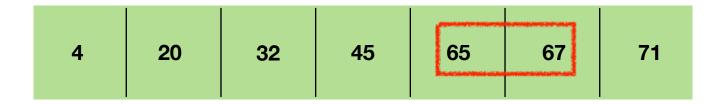


45<65







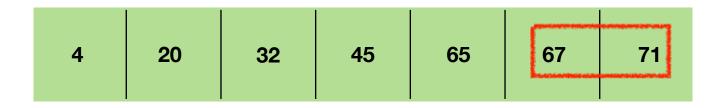


65<67







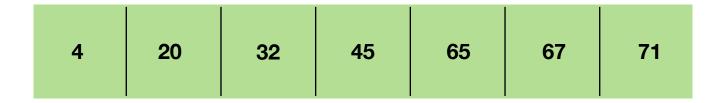


67<71



4	20	32	45	65	67	71
---	----	----	----	----	----	----





No swaps in the sixth pass: Done



#### **Bubble Sort Pseudocode**

```
bubbleSort(Array A : list of sortable items, n)
   n = A.size //1 unit time.
    flag = false
   do //each pass take O(n) ///Question? How many passes?
        flag = false //O(1)
        for i = 1 to n-1 // (n-1)* O(1) = O(n)
            if A[i] > A[i+1] // 1 line
               swap(A[i], A[i+1]) // 3 lines
               flag = true. // 1 line
   while(flag)
                                        What is the running time?
```

# **Worst-case Running Time T(n)**

```
bubbleSort(Array A : list of sortable items, n)
                                                               times
                                                     cost
    flag = false
    do
                                                              #ofPass
        flag = false
        for i = 1 to n-1
                                                           (n-1) * #ofPass
            if A[i] > A[i+1]
                                                           (n-1) * #ofPass
                                                           \leq (n-1) * \#ofPass
                swap(A[i], A[i+1])
                flag = true
                                                           \leq (n-1) * \#ofPass
    while(flag)
                                                              #ofPass
```



# **Worst-case Running Time T(n)**

```
bubbleSort(Array A : list of sortable items, n)
                                                              times
                                                    cost
    flag = false
    do
        flag = false
                                                             #ofPass
        for i = 1 to n-1
                                                          (n-1) * #ofPass
                                                          (n-1) * #ofPass
            if A[i] > A[i+1]
                                                     1 <=(n-1) * \#ofPass
               swap(A[i], A[i+1])
                                                          \leq (n-1) * \#ofPass
               flag = true
    while(flag)
                                                             #ofPass
                 T(n) = 2 * \#ofPass + 4 * (n-1) * \#ofPass + 1
```



# **Worst-case Running Time T(n)**

```
bubbleSort(Array A : list of sortable items, n)
                                                               times
                                                     cost
    flag = false
    do
        flag = false
                                                              #ofPass
        for i = 1 to n-1
                                                           (n-1) * \#ofPass
                                                           (n-1) * #ofPass
            if A[i] > A[i+1]
                                                          \leq (n-1) * \#ofPass
                swap(A[i], A[i+1])
                                                           \leq (n-1) * \#ofPass
               flag = true
    while(flag)
                                                              #ofPass
                 T(n) = 2 * \#ofPass + 4 * (n-1) * \#ofPass + 1
```



#ofPass = ?

A is the reverse order.

71	67	65	45	32	20	4
----	----	----	----	----	----	---



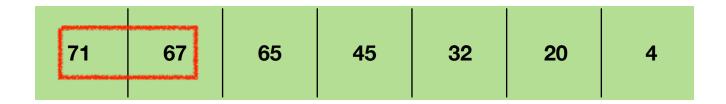
A is the reverse order.





#### A is the reverse order.

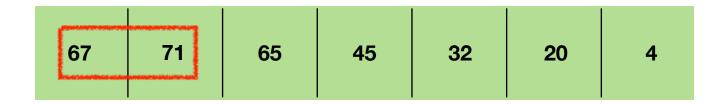
#### **First Pass:**





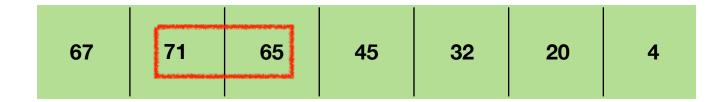
#### A is the reverse order.

#### **First Pass:**





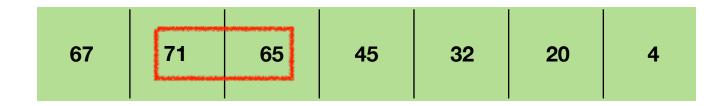
A is the reverse order.





A is the reverse order.

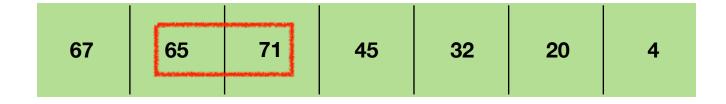
#### **First Pass:**





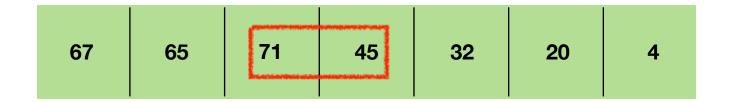
A is the reverse order.

#### **First Pass:**





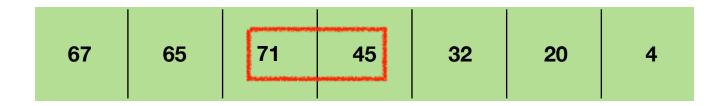
A is the reverse order.





A is the reverse order.

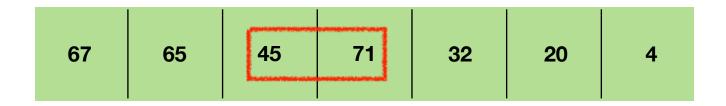
#### **First Pass:**





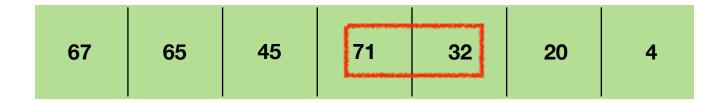
A is the reverse order.

#### **First Pass:**





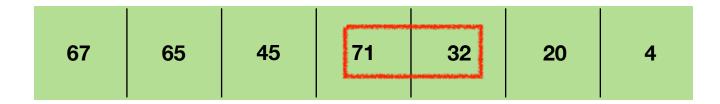
A is the reverse order.





A is the reverse order.

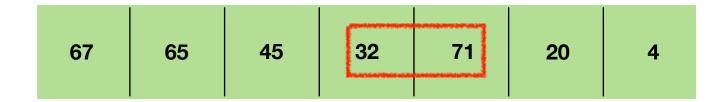
#### **First Pass:**





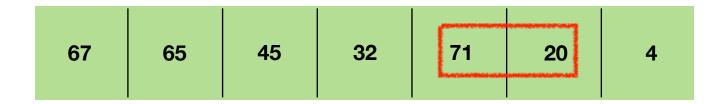
A is the reverse order.

#### **First Pass:**





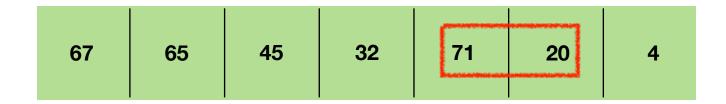
A is the reverse order.





A is the reverse order.

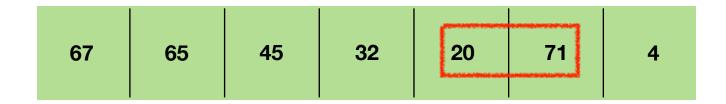
#### **First Pass:**





A is the reverse order.

#### **First Pass:**





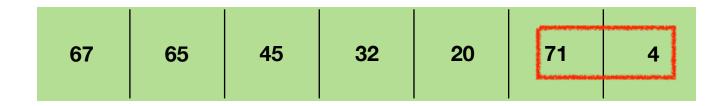
A is the reverse order.

						-
67	65	45	32	20	71	4
					Bransmann	······································



A is the reverse order.

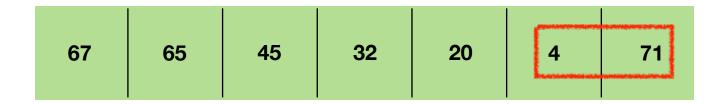
#### **First Pass:**





A is the reverse order.

#### **First Pass:**





A is the reverse order.

67	65	45	32	20	4	71
----	----	----	----	----	---	----



A is the reverse order.

67	65	45	32	20	4	71
----	----	----	----	----	---	----





# **Bubble Sort - Worst Case (cont.)**

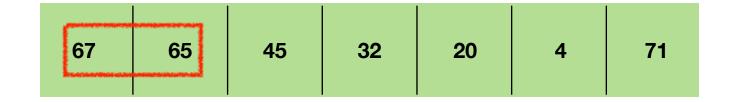
#### **Second Pass:**

67	65	45	32	20	4	71
----	----	----	----	----	---	----



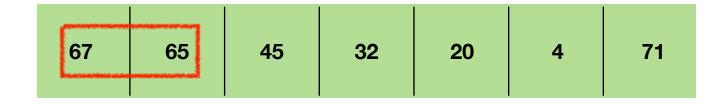
# **Bubble Sort - Worst Case (cont.)**

#### **Second Pass:**



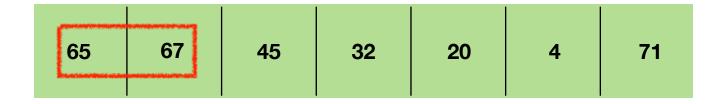


#### **Second Pass:**





#### **Second Pass:**



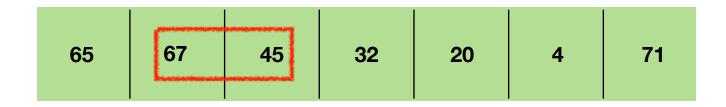


#### **Second Pass:**



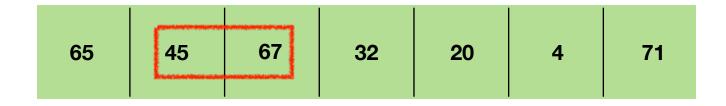


#### **Second Pass:**



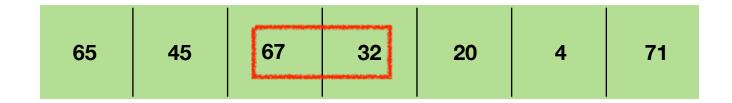


#### **Second Pass:**



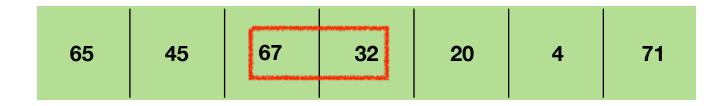


#### **Second Pass:**



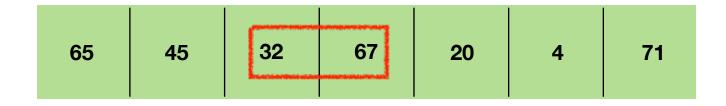


#### **Second Pass:**



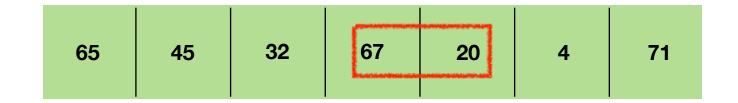


#### **Second Pass:**



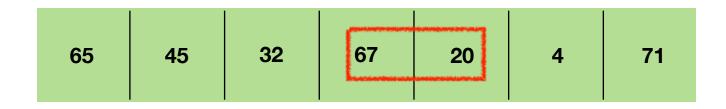


#### **Second Pass:**



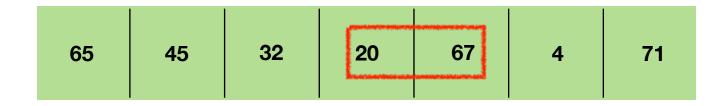


#### **Second Pass:**



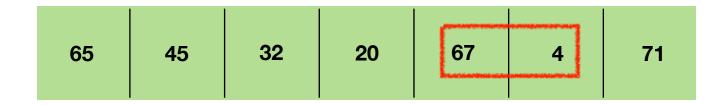


#### **Second Pass:**



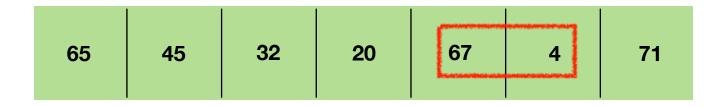


#### **Second Pass:**



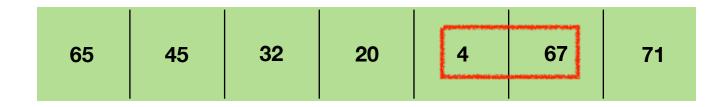


#### **Second Pass:**



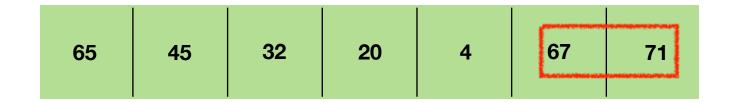


#### **Second Pass:**



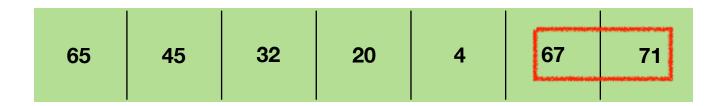


#### **Second Pass:**





#### **Second Pass:**



67<71

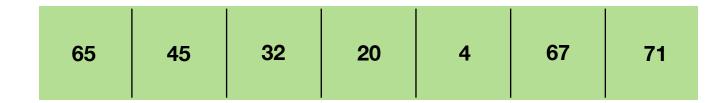


#### **Second Pass:**

65	45	32	20	4	67	71
----	----	----	----	---	----	----



#### **Second Pass:**



Swaps occurred in the second pass —> Next Pass



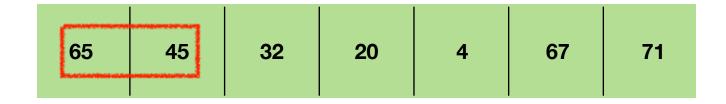
65	45	32	20	4	67	71
----	----	----	----	---	----	----





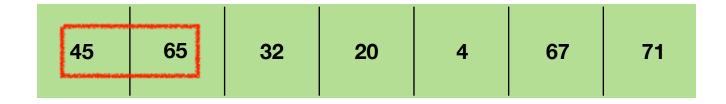


#### **Third Pass:**

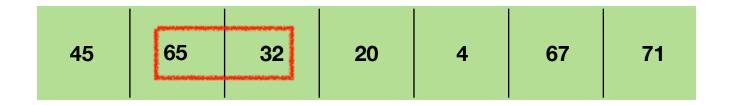




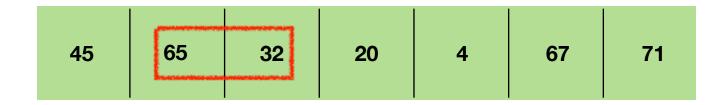
#### **Third Pass:**





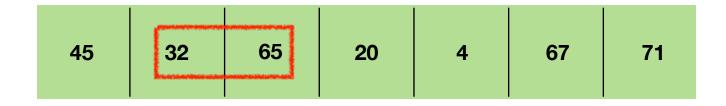






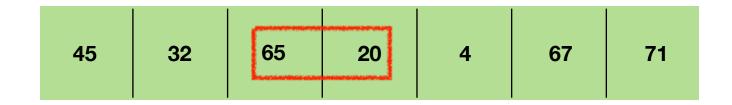
65>32





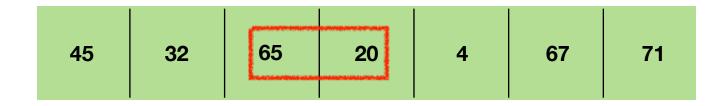
65>32





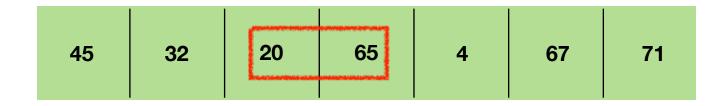


#### **Third Pass:**

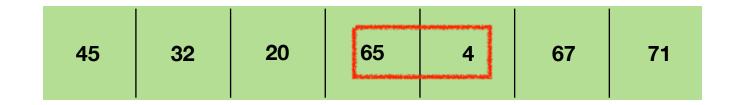




#### **Third Pass:**

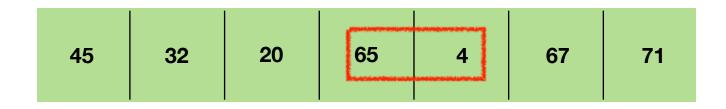






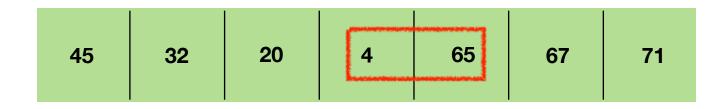


#### **Third Pass:**

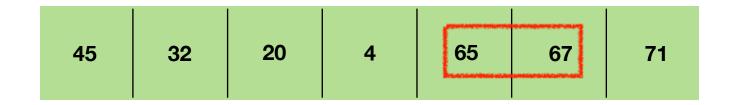




#### **Third Pass:**









#### **Third Pass:**



65<67







#### **Third Pass:**



67<71



45	32	20	4	65	67	71
----	----	----	---	----	----	----



#### **Third Pass:**



Swaps occurred in the third pass —> Next Pass



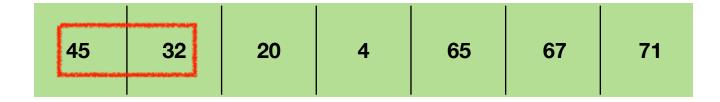
45	32	20	4	65	67	71
----	----	----	---	----	----	----







### **Fourth Pass:**





### **Fourth Pass:**









#### **Fourth Pass:**

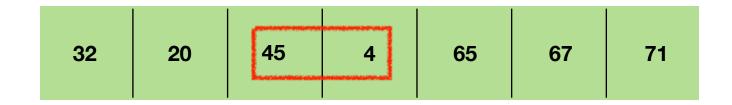




### **Fourth Pass:**

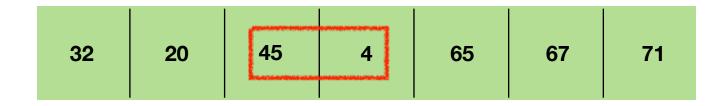






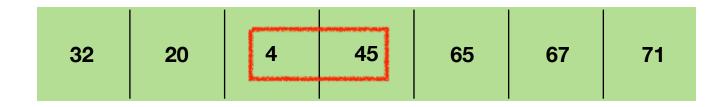


### **Fourth Pass:**

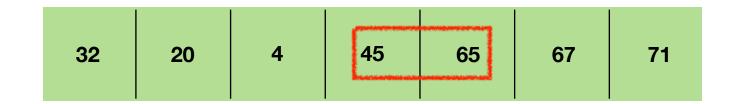




#### **Fourth Pass:**

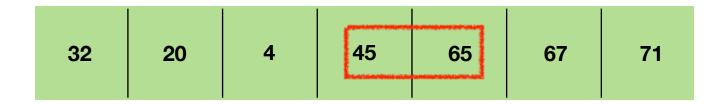






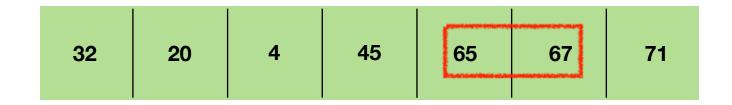


### **Fourth Pass:**



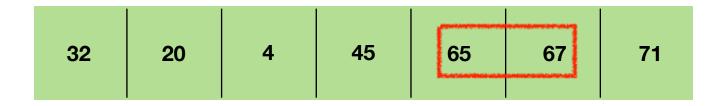
45<65





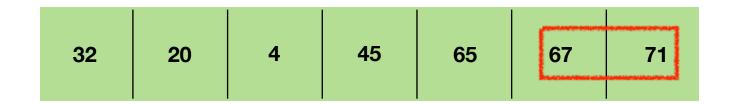


### **Fourth Pass:**



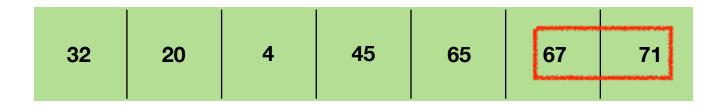
65<67







### **Fourth Pass:**



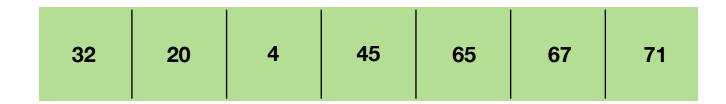
67<71



32	20	4	45	65	67	71
----	----	---	----	----	----	----



#### **Fourth Pass:**

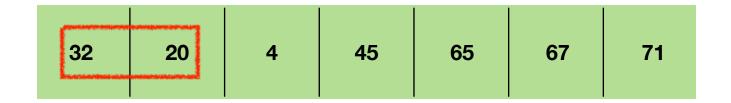


Swaps occurred in the fourth pass —> Next Pass



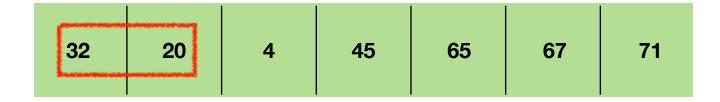
32	20	4	45	65	67	71
----	----	---	----	----	----	----





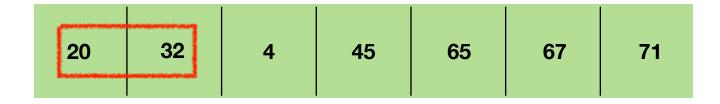


#### **Fifth Pass:**

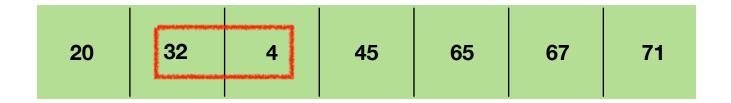




#### **Fifth Pass:**

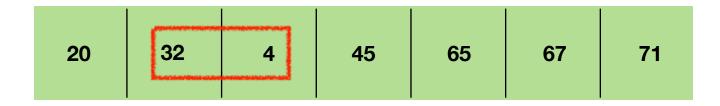






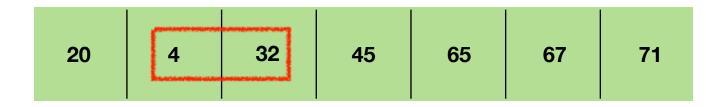


#### **Fifth Pass:**

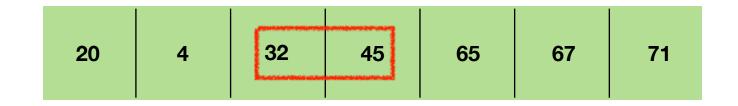




#### **Fifth Pass:**

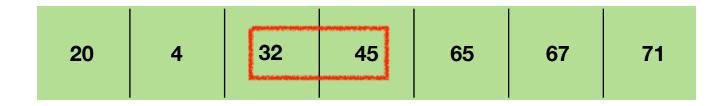






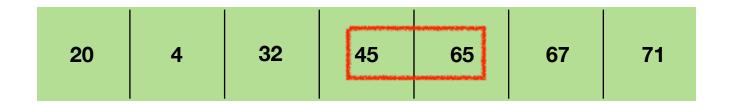


#### **Fifth Pass:**



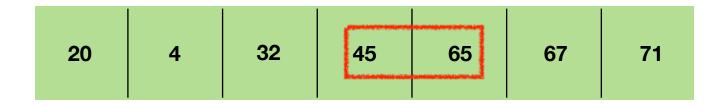
32<45





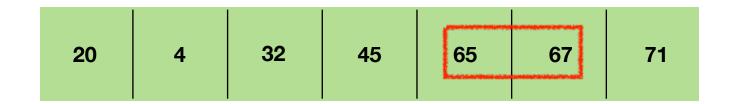


#### **Fifth Pass:**



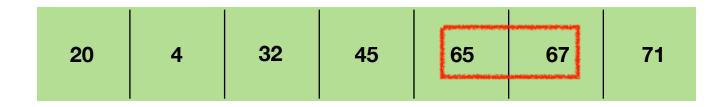
45<65





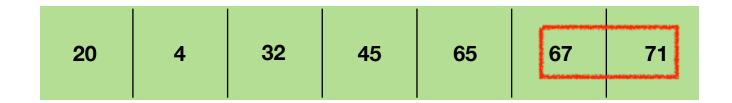


#### **Fifth Pass:**



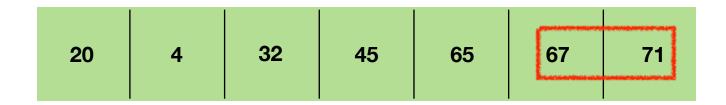
65<67







#### **Fifth Pass:**



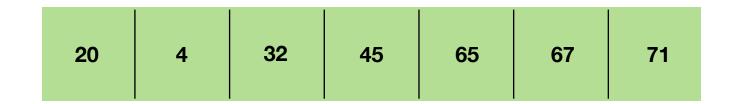
67<71



20	4	32	45	65	67	71
----	---	----	----	----	----	----



#### **Fifth Pass:**

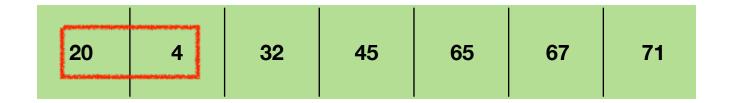


Swaps occurred in the fifth pass -> Next Pass



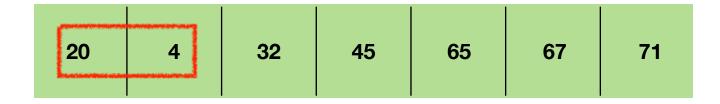
20	4	32	45	65	67	71
----	---	----	----	----	----	----







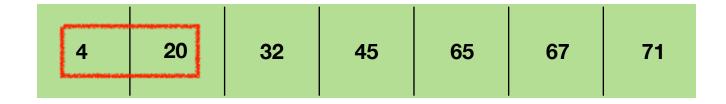
#### **Sixth Pass:**



20>4

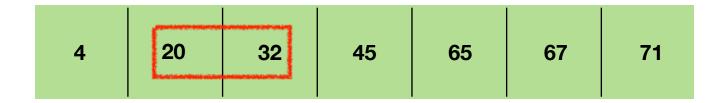


### **Sixth Pass:**



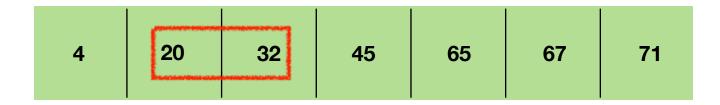
20>4



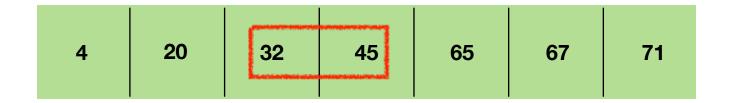




#### **Sixth Pass:**

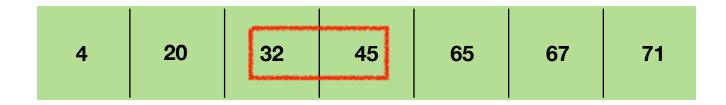




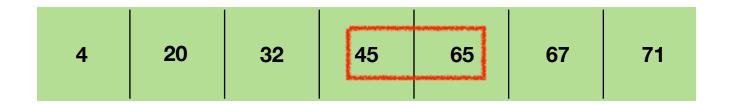




#### **Sixth Pass:**

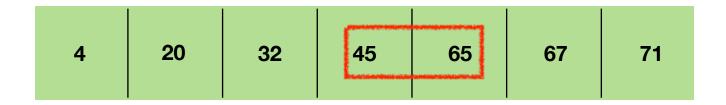




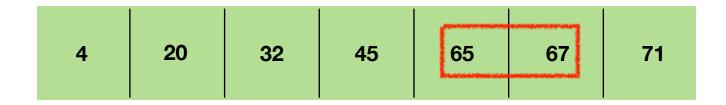




### **Sixth Pass:**

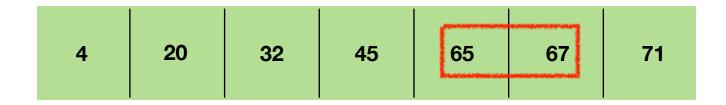




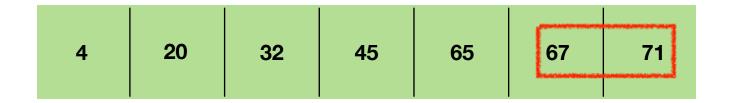




### **Sixth Pass:**

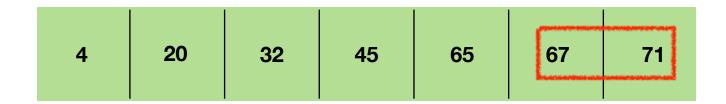








### **Sixth Pass:**

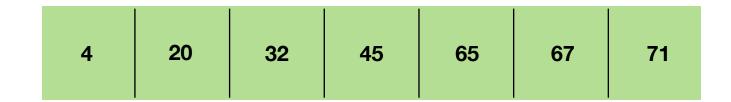




4	20	32	45	65	67	71
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### **Sixth Pass:**

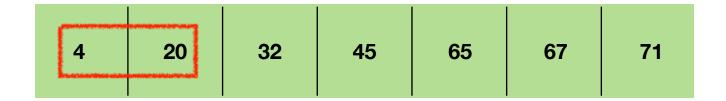


Swaps occurred in the sixth pass —> Next Pass



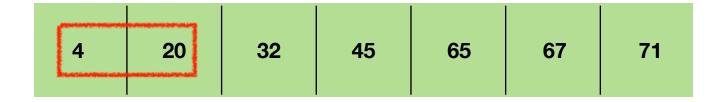
4	20	32	45	65	67	71
---	----	----	----	----	----	----



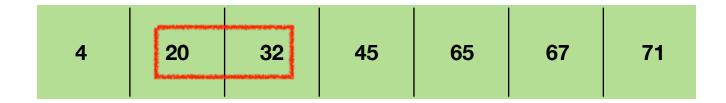




#### **Seventh Pass:**

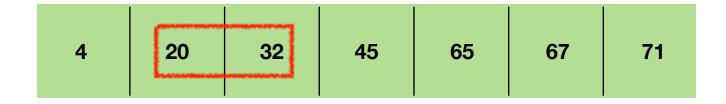




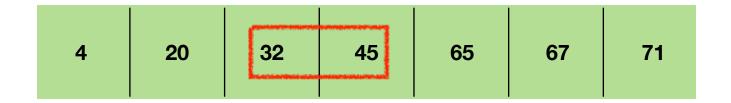




#### **Seventh Pass:**

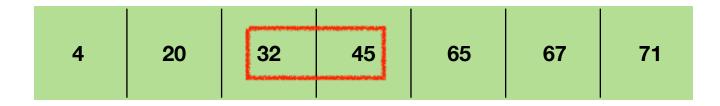




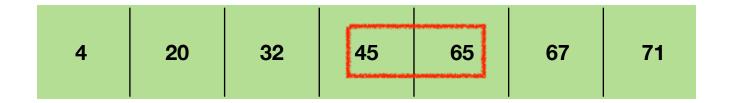




#### **Seventh Pass:**

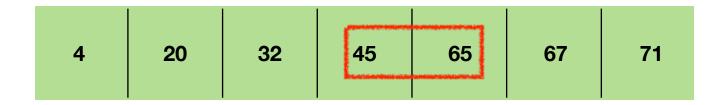




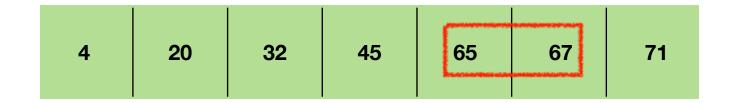




#### **Seventh Pass:**

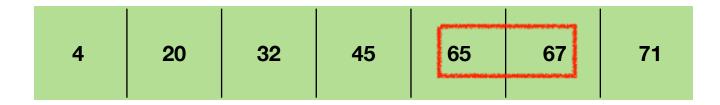








### **Seventh Pass:**

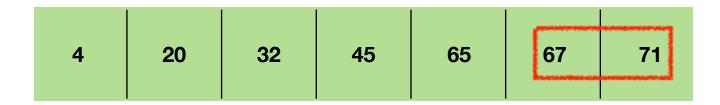




					***************************************		
4	20	32	45	65	67	71	
					- Incommonwe		



#### **Seventh Pass:**

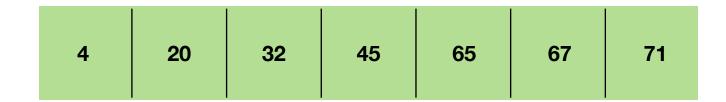




4	20	32	45	65	67	71
---	----	----	----	----	----	----



#### **Seventh Pass:**



No swaps occurred in the seventh pass —> Done



### Running Time T(n) in Worst Case

```
bubbleSort(Array A : list of sortable items, n)
                                                               times
                                                     cost
    flag = false
    do
                                                              #ofPass
        flag = false
        for i = 1 to n-1
                                                           (n-1) * #ofPass
            if A[i] > A[i+1]
                                                           (n-1) * #ofPass
                swap(A[i], A[i+1])
                                                           \leq (n-1) * \#ofPass
                flag = true
                                                           \leq (n-1) * \#ofPass
    while(flag)
                                                              #ofPass
```



### Running Time T(n) in Worst Case

```
bubbleSort(Array A : list of sortable items, n)
                                                                times
                                                     cost
    flag = false
    do
        flag = false
                                                              #ofPass
        for i = 1 to n-1
                                                            (n-1) * #ofPass
            if A[i] > A[i+1]
                                                           (n-1) * #ofPass
                                                           \leq (n-1) * \#ofPass
                swap(A[i], A[i+1])
                                                           \leq (n-1) * \#ofPass
               flag = true
    while(flag)
                                                              #ofPass
```



```
T(n) = 2* \#ofPass + 4(n-1)* \#ofPass + 1 = 4n^2 -2n + 1
```

### Running Time T(n) in Worst Case

```
bubbleSort(Array A : list of sortable items, n)
                                                               times
                                                     cost
    flag = false
    do
        flag = false
                                                              #ofPass
        for i = 1 to n-1
                                                           (n-1) * #ofPass
            if A[i] > A[i+1]
                                                           (n-1) * #ofPass
                                                           \leq (n-1) * \#ofPass
                swap(A[i], A[i+1])
                                                           \leq (n-1) * \#ofPass
               flag = true
    while(flag)
                                                              #ofPass
```

#ofPass = n



$$T(n) = 2* \#ofPass + 4(n-1)* \#ofPass + 1 = 4n^2 -2n + 1$$

### **Worst-Case Time Complexity T(n)**

```
bubbleSort(Array A : list of sortable items, n)
                                                                times
                                                     cost
    flag = false
    do
        flag = false
                                                               #ofPass
        for i = 1 to n-1
                                                            (n-1) * \#ofPass
            if A[i] > A[i+1]
                                                            (n-1) * #ofPass
                                                           \leq (n-1) * \#ofPass
                swap(A[i], A[i+1])
                                                           \leq (n-1) * \#ofPass
                flag = true
    while(flag)
                                                               #ofPass
```



$$T(n) = 4n^2 - 2n + 1 = O(n^2)$$

### **Worst-Case Time Complexity T(n)**

```
bubbleSort(Array A : list of sortable items, n)
                                                                times
                                                     cost
    flag = false
    do
        flag = false
                                                               #ofPass
        for i = 1 to n-1
                                                            (n-1) * \#ofPass
            if A[i] > A[i+1]
                                                            (n-1) * #ofPass
                swap(A[i], A[i+1])
                                                            \leq (n-1) * \#ofPass
                                                            \leq (n-1) * \#ofPass
                flag = true
    while(flag)
                                                               #ofPass
```

Two rules:



$$T(n) = 4n^2 - 2n + 1 = O(n^2)$$

• Drop the leading constant

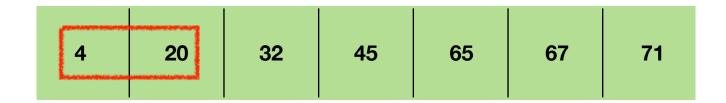


A is given in the sorted order.

4	20	32	45	65	67	71
---	----	----	----	----	----	----



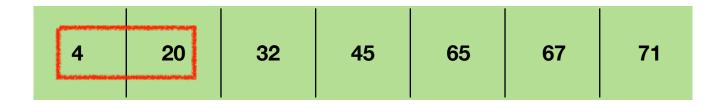
A is given in the sorted order.





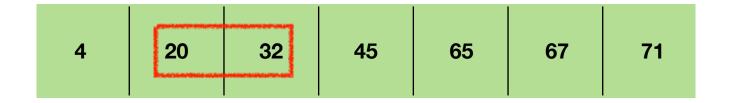
### A is given in the sorted order.

#### **First Pass:**





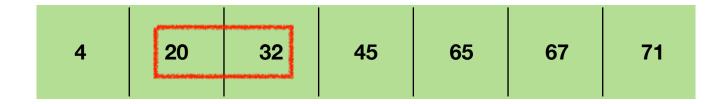
A is given in the sorted order.





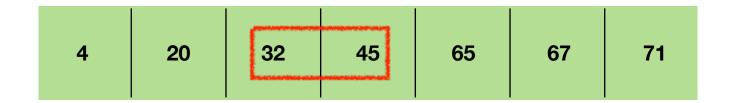
A is given in the sorted order.

#### **First Pass:**





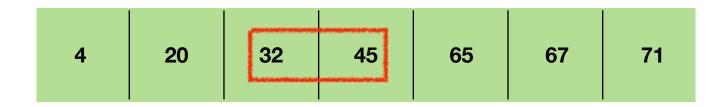
A is given in the sorted order.





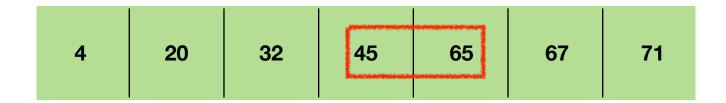
### A is given in the sorted order.

#### **First Pass:**





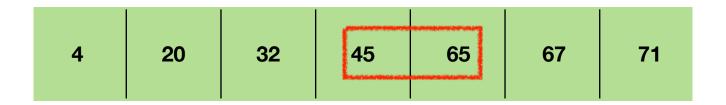
A is given in the sorted order.





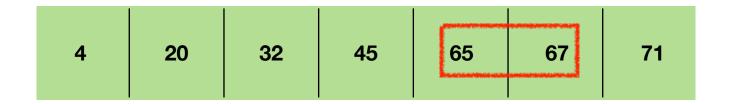
### A is given in the sorted order.

#### **First Pass:**





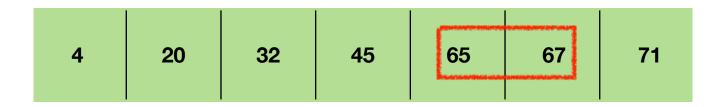
A is given in the sorted order.





### A is given in the sorted order.

#### **First Pass:**





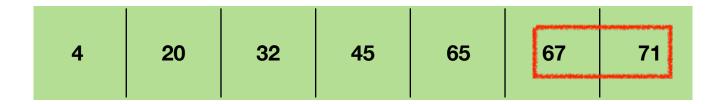
A is given in the sorted order.





A is given in the sorted order.

#### **First Pass:**





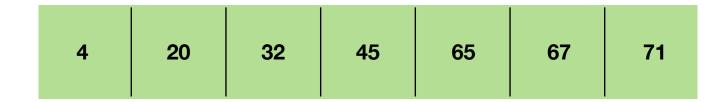
A is given in the sorted order.

4 20 32 45 65 67	71
------------------	----



A is given in the sorted order.

#### **First Pass:**

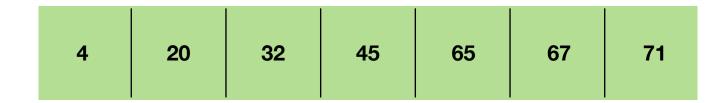


No swaps occurred in the first pass -> Done



A is given in the sorted order.

#### **First Pass:**



No swaps occurred in the first pass -> Done



#ofPass = 1

# Running Time T(n) in Best Case



# Running Time T(n) in Best Case

#ofPass = 1



# Running Time T(n) in Best Case

#ofPass = 1



$$T(n) = 2* \#ofPass + 2(n-1)* \#ofPass + 1 = 2n + 1 = O(n)$$

```
For every pass:
Do {
    Flag = false;
for i=1:n-1
    If A[i] > A[i+1]
    {
        swap(A[i], A[i+1])
        {
            temp= A[i+1];
            A[i+1] = A[i];
            A[i] = temp
        }
        Flag = true: //this pass has swap
    }
while(flag)
```

How many passes?
If every two adjacent element
Are in the increasing order,
NO SWAPS OCCURED IN ONE PASS
BUBBLE SORT ENDS.

For an algorithm to solve a problem:

The correctness.

Every pass check and correct the order of every two adjacent number.

The whole list is in in==== the correctness of

The time complexity of an algorithm

