

Sorting I

Introduction

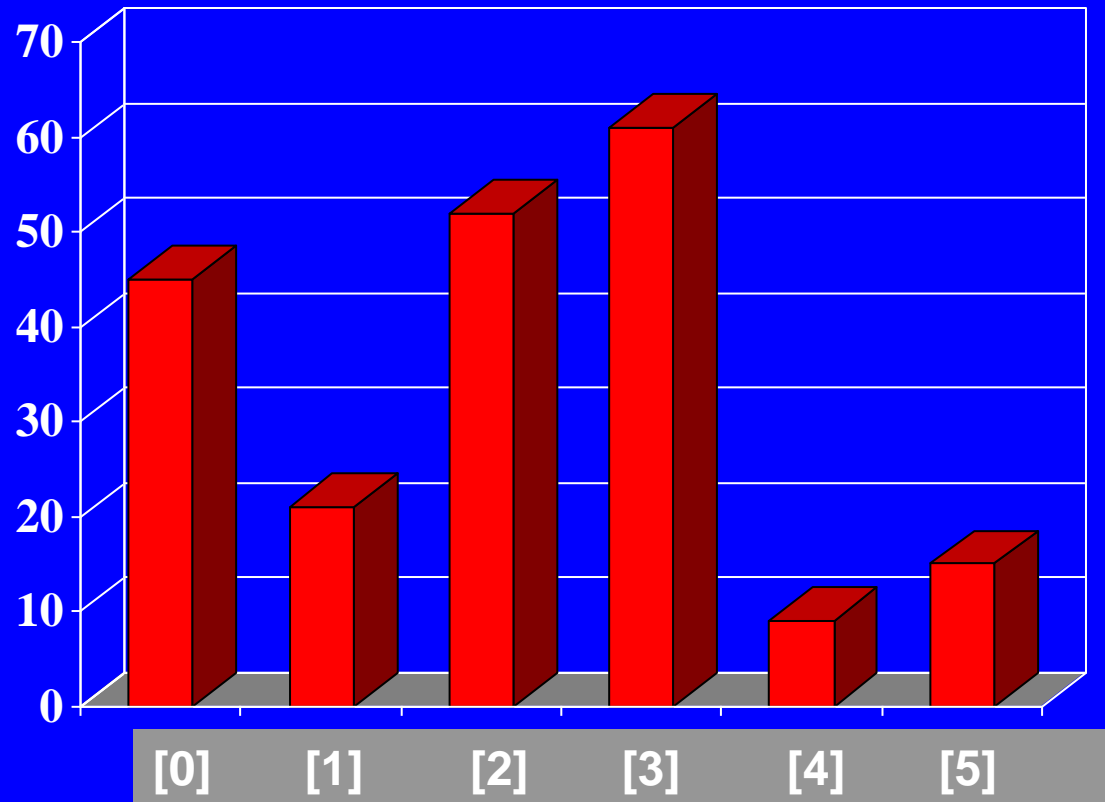
- Common problem: sort a list of values, starting from lowest to highest.
 - List of exam scores
 - Words of dictionary in alphabetical order
 - Students names listed alphabetically
 - Student records sorted by ID#
- Generally, we are given a list of records that have *keys*. These keys are used to define an ordering of the items in the list.

Quadratic Sorting Algorithms

- We are given n records to sort.
- There are a number of simple sorting algorithms whose worst and average case performance is quadratic $O(n^2)$:
 - Selection sort
 - Insertion sort
 - Bubble sort

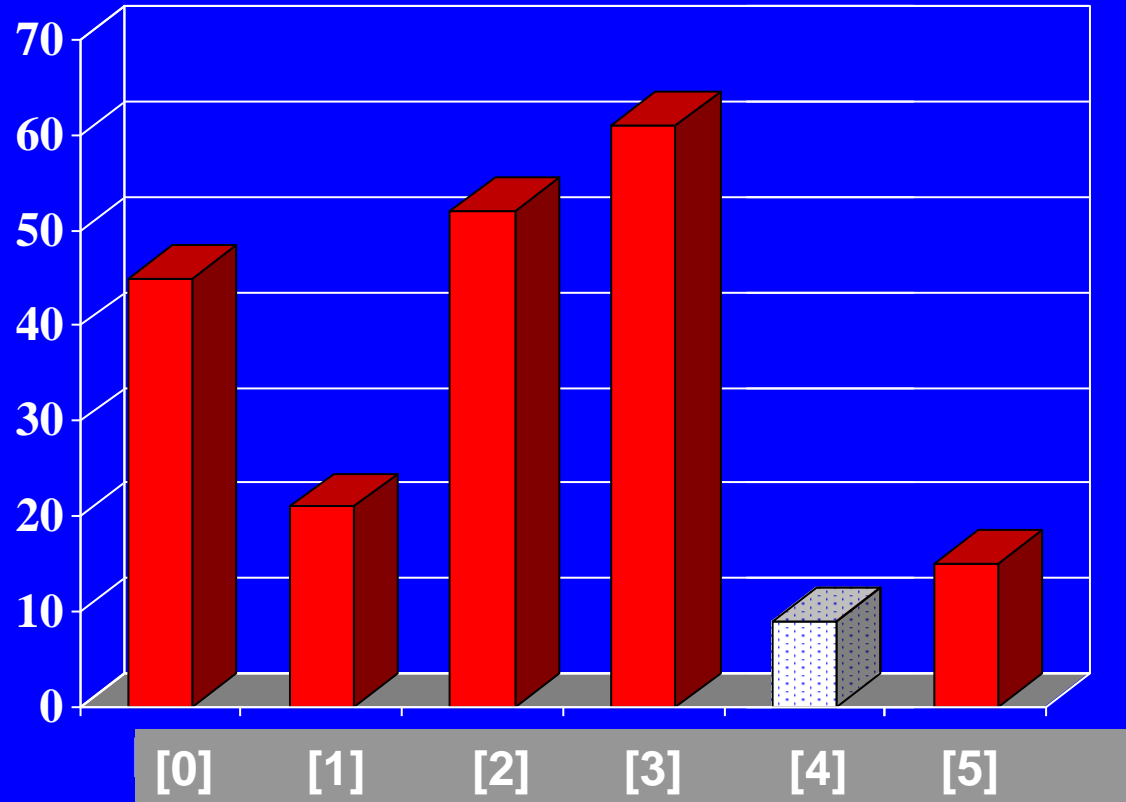
Sorting an Array of Integers

- Example: we are given an array of six integers that we want to sort from smallest to largest



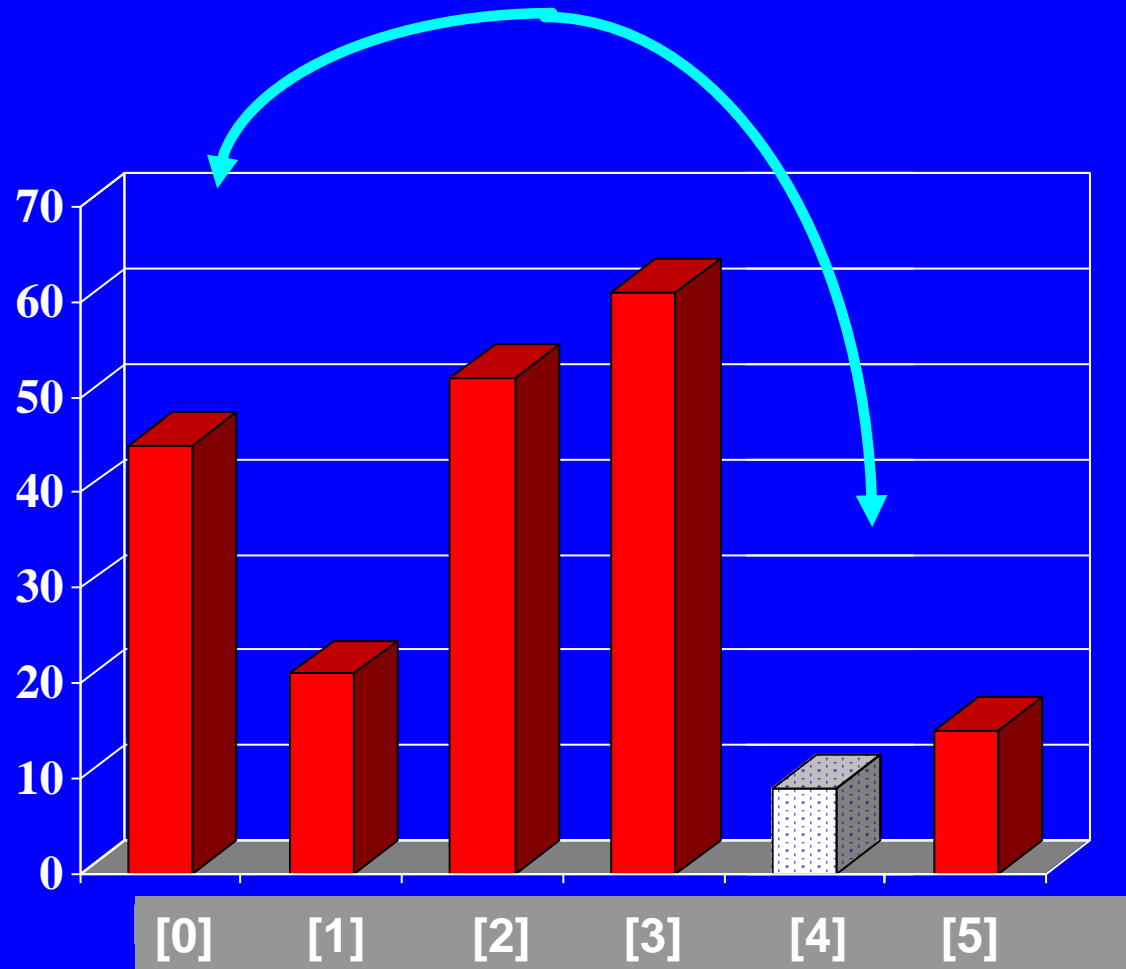
The Selection Sort Algorithm

- Start by finding the smallest entry.



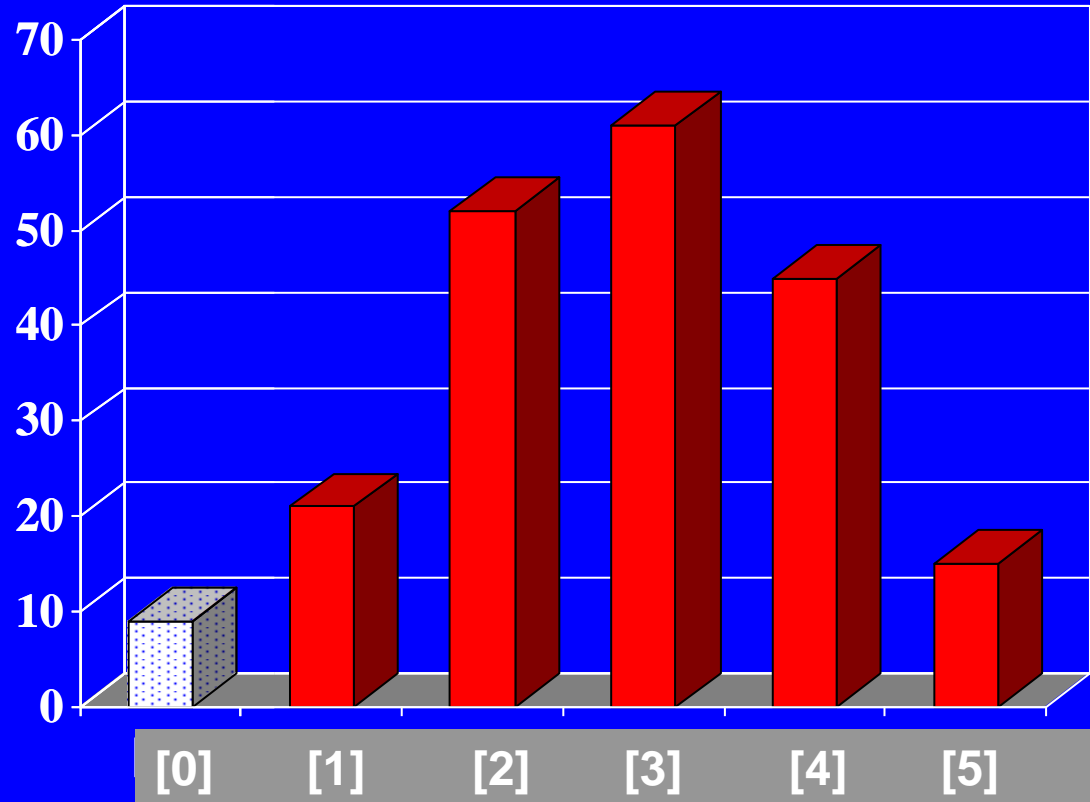
The Selection Sort Algorithm

- Swap the smallest entry with the first entry.

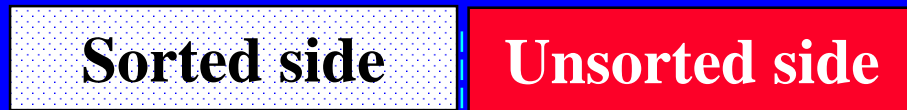


The Selection Sort Algorithm

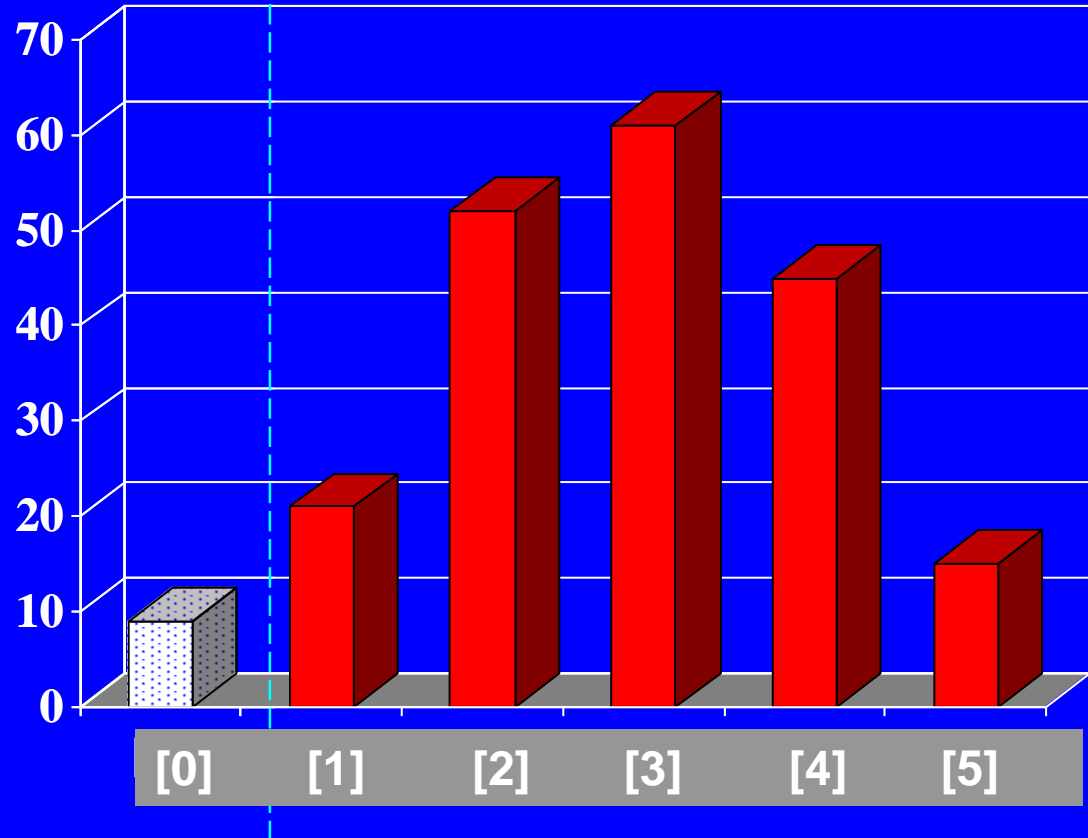
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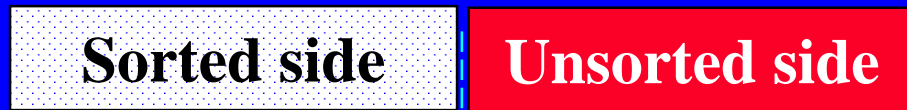
The Selection Sort Algorithm



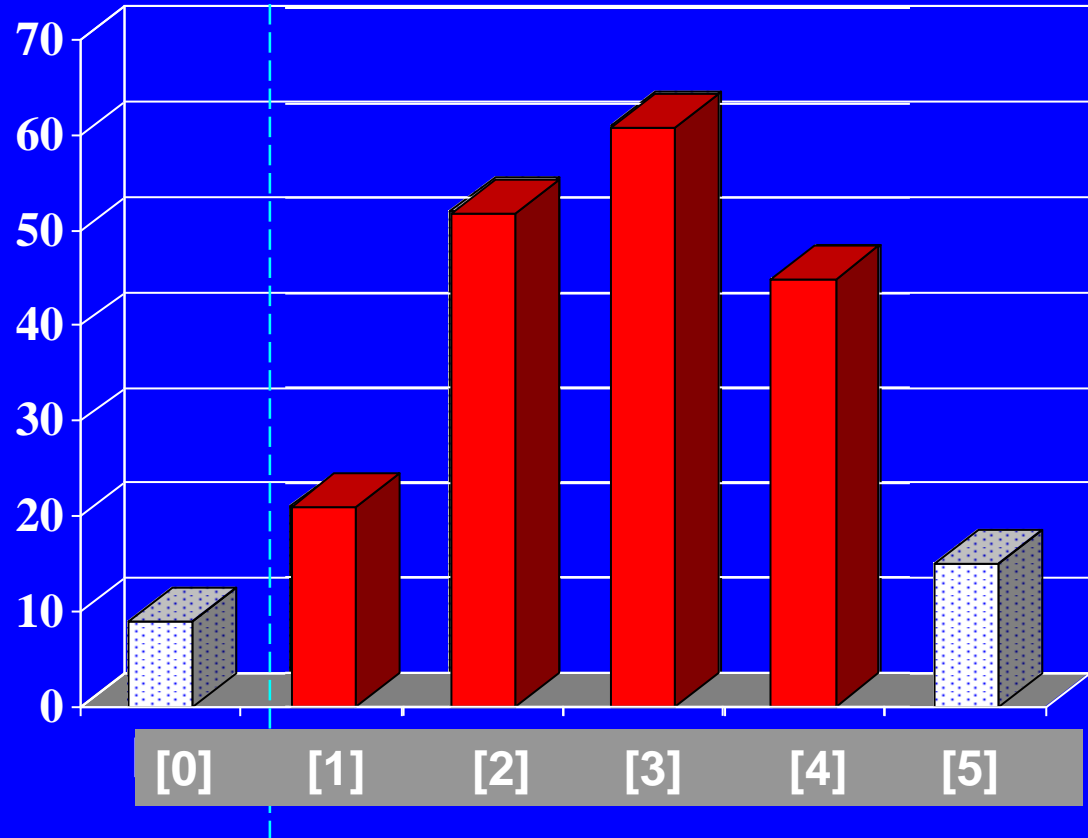
- Part of the array is now sorted.



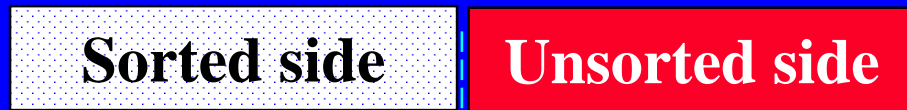
The Selection Sort Algorithm



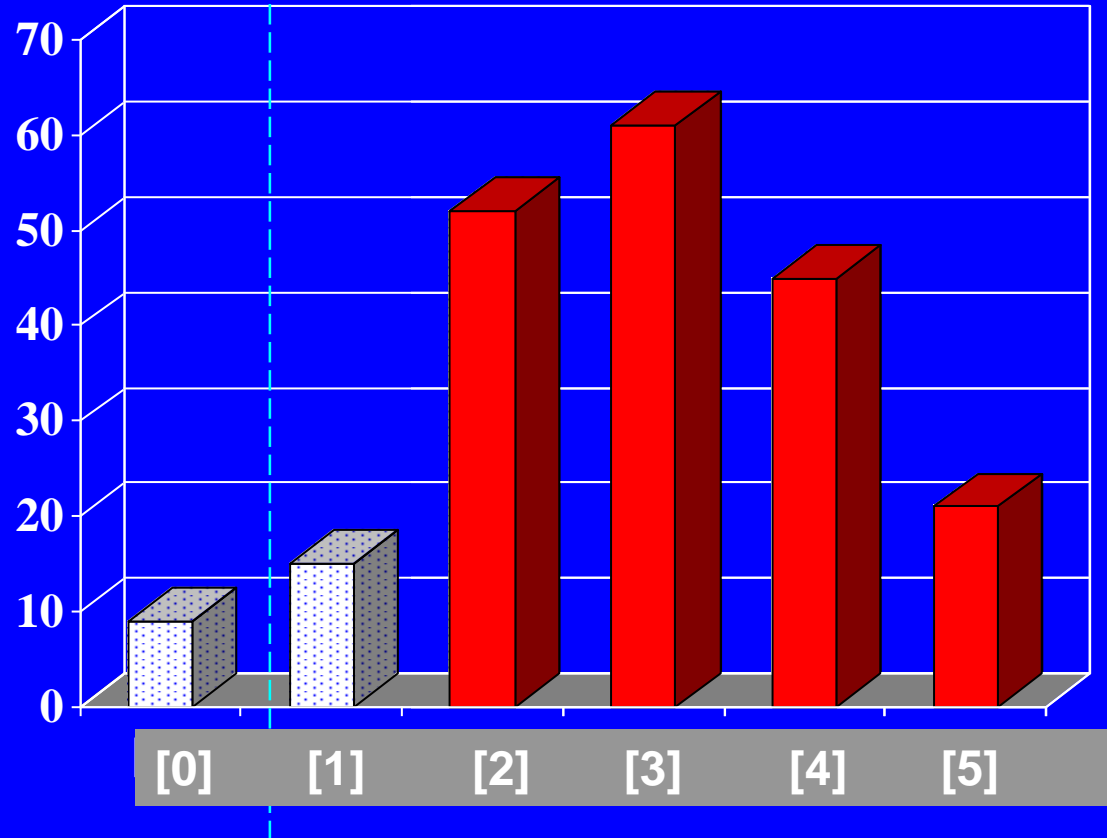
- Find the smallest element in the unsorted side.



The Selection Sort Algorithm

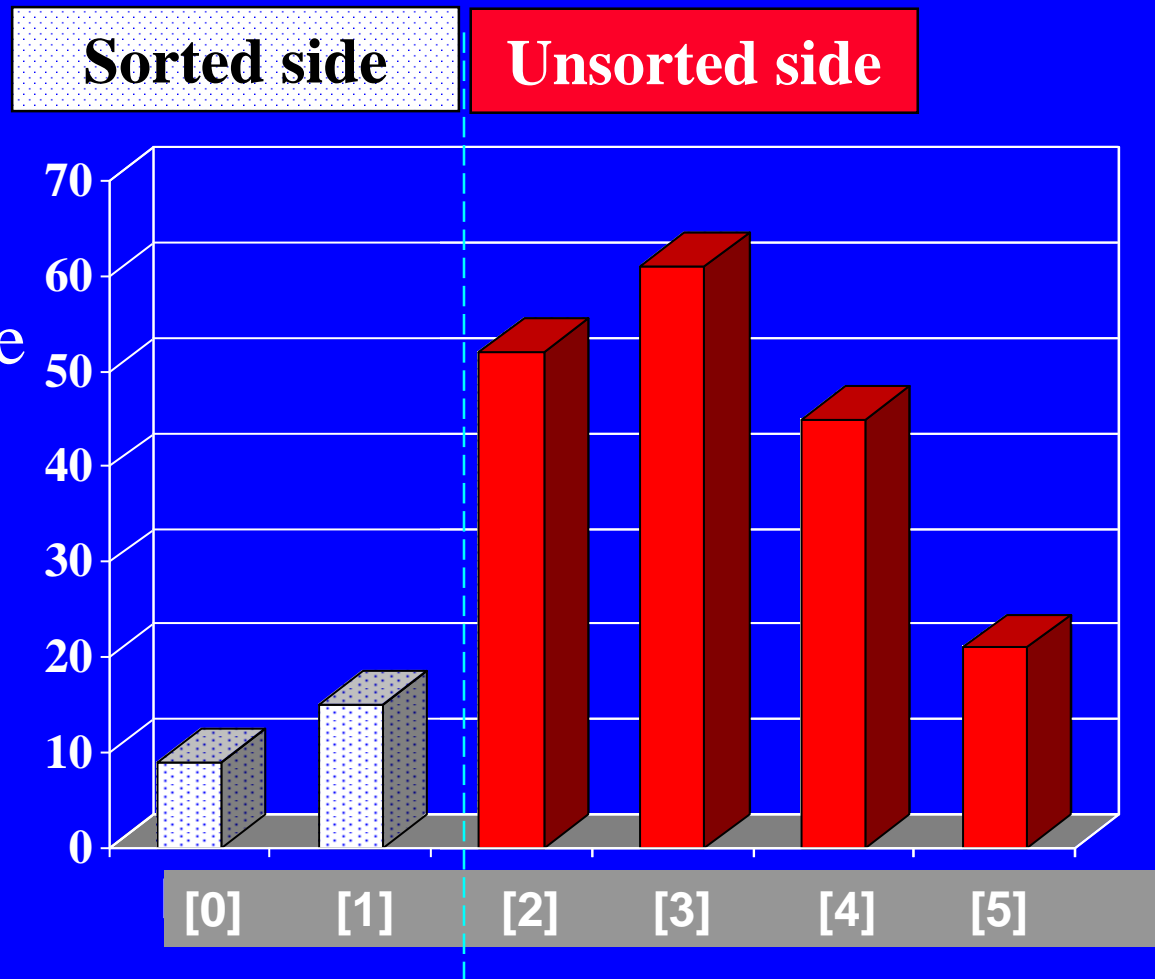


- Swap with the front of the unsorted side.



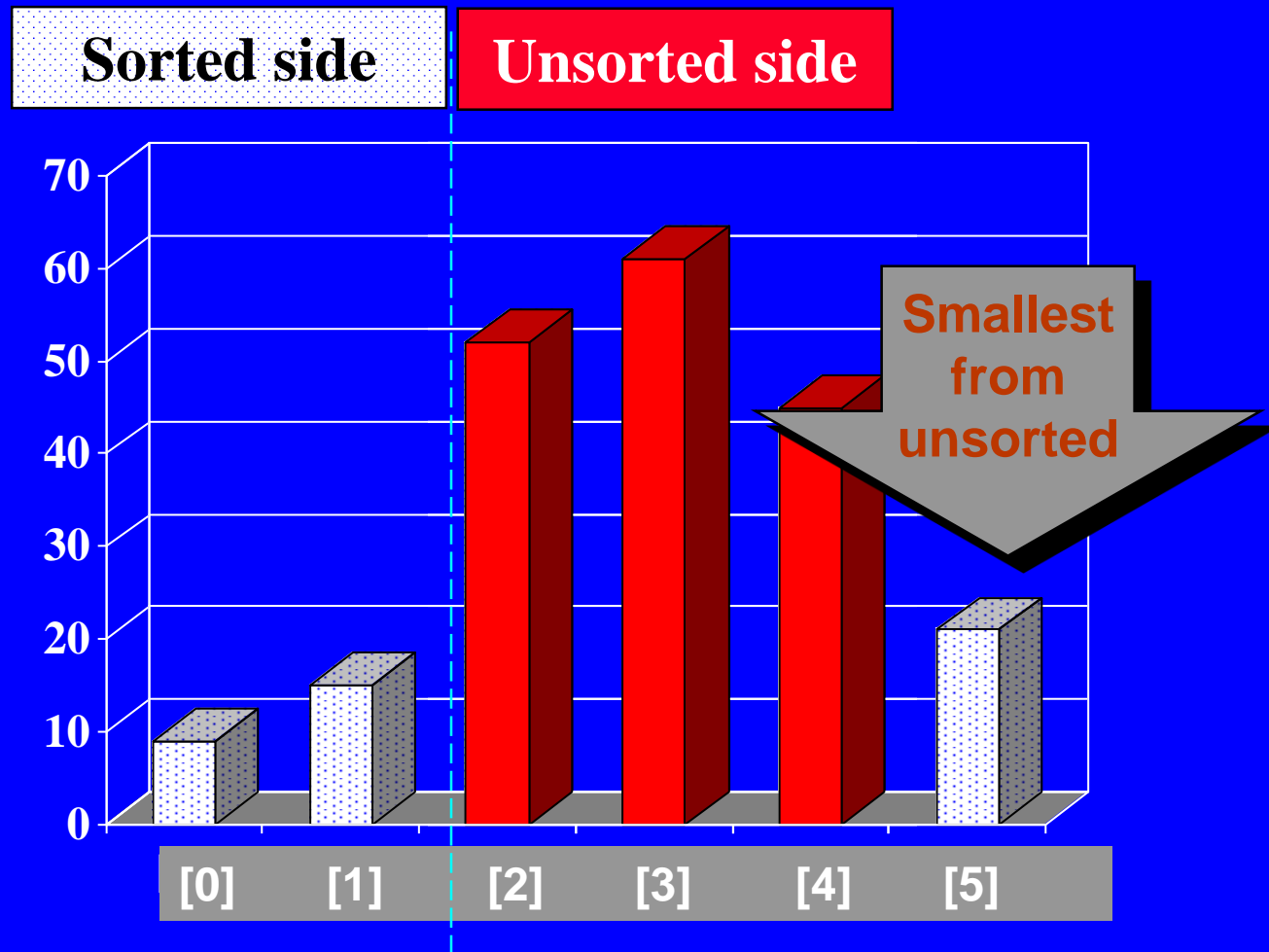
The Selection Sort Algorithm

- We have increased the size of the sorted side by one element.



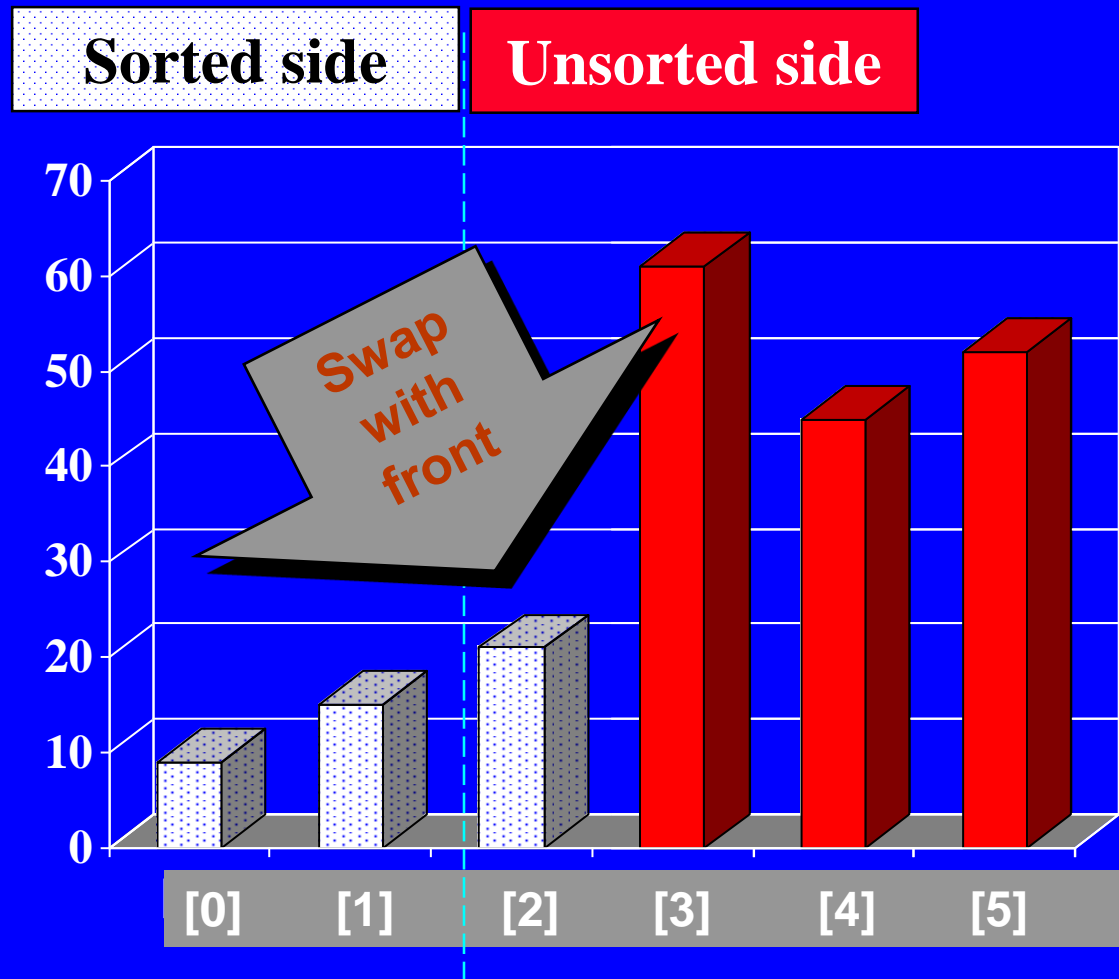
The Selection Sort Algorithm

- The process continues...



The Selection Sort Algorithm

- The process continues...



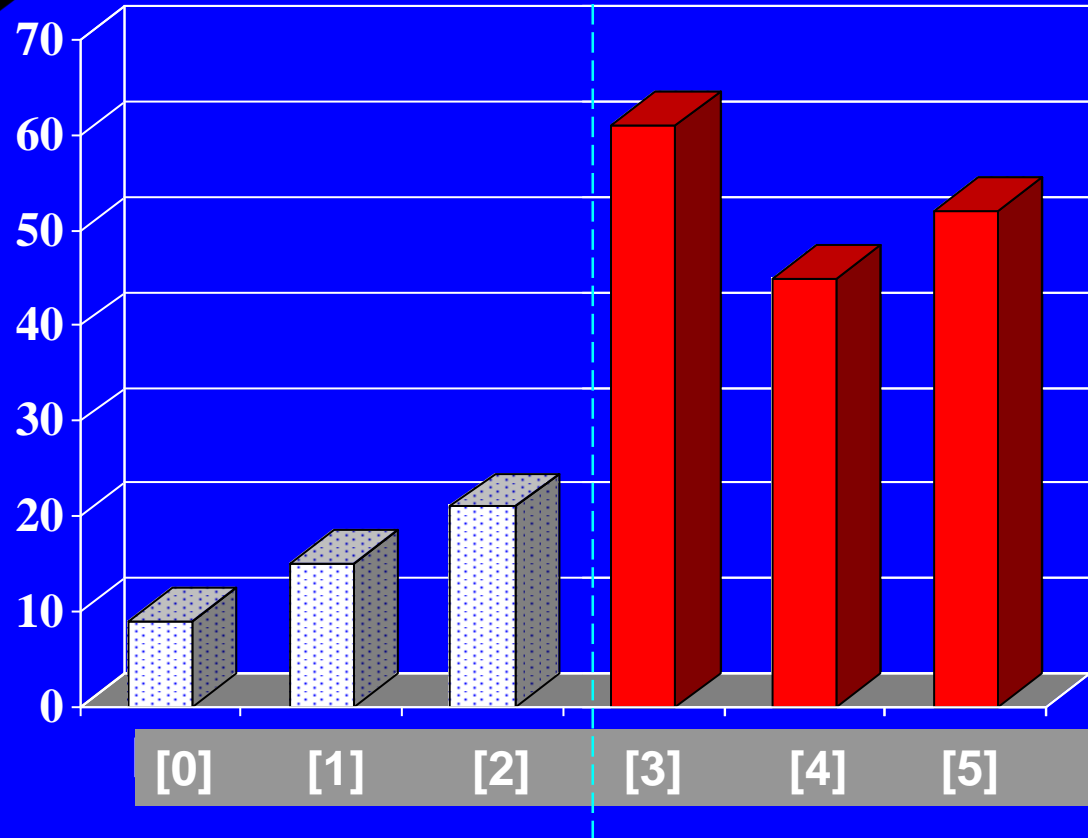
The Selection Sort Algorithm

Sorted side
is bigger

Sorted side

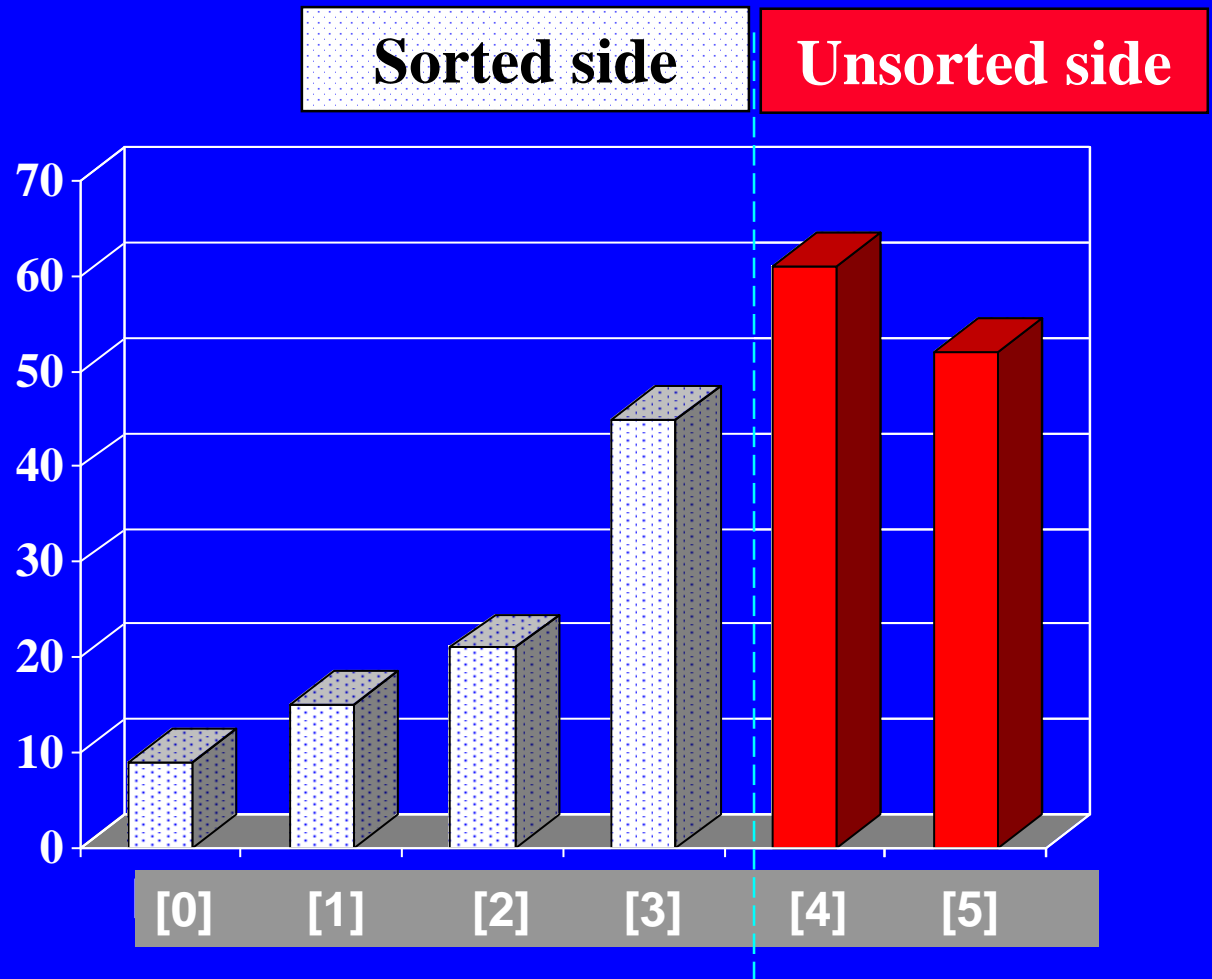
Unsorted side

- The process continues...



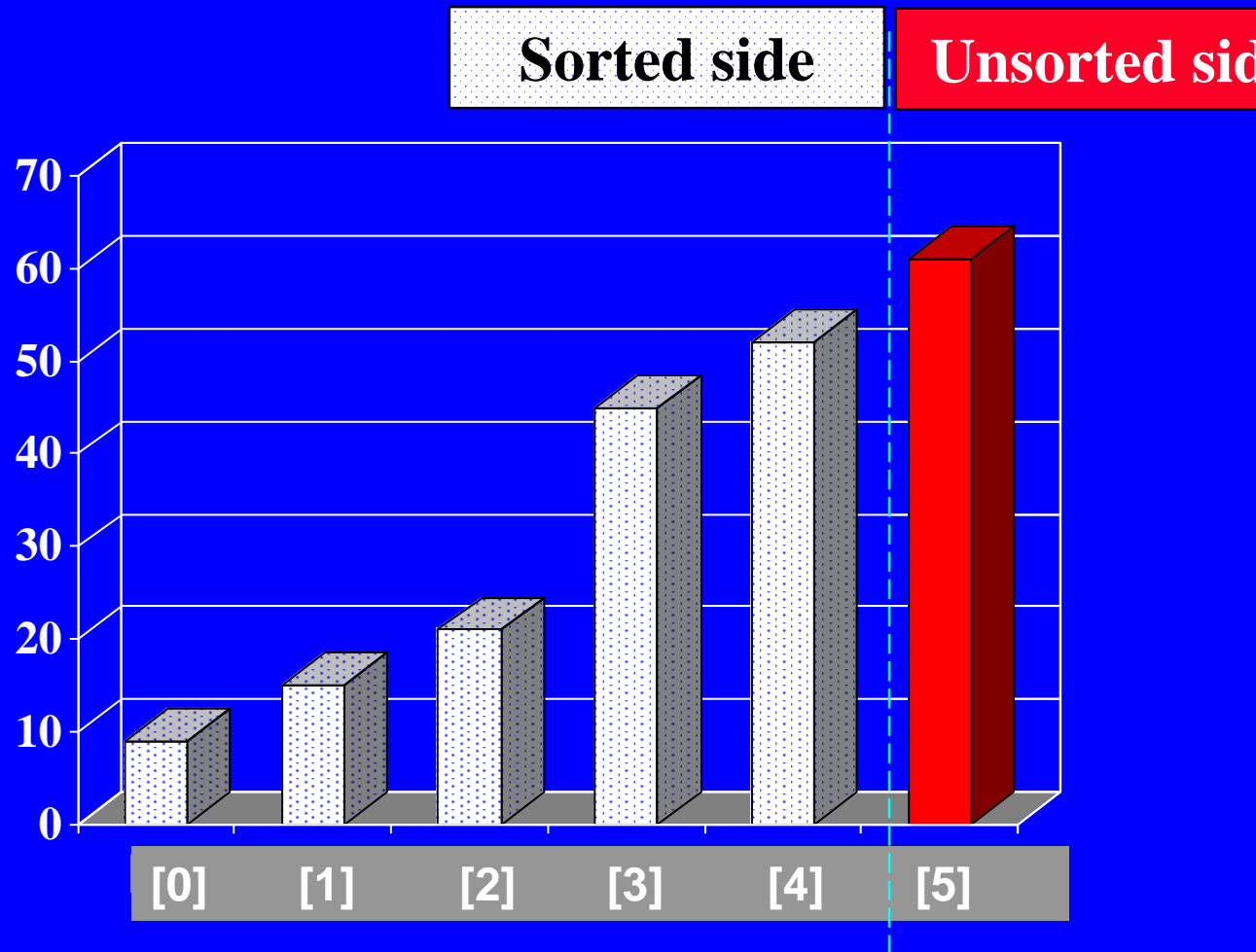
The Selection Sort Algorithm

- The process keeps adding one more number to the sorted side.
- The sorted side has the smallest numbers, arranged from small to large.



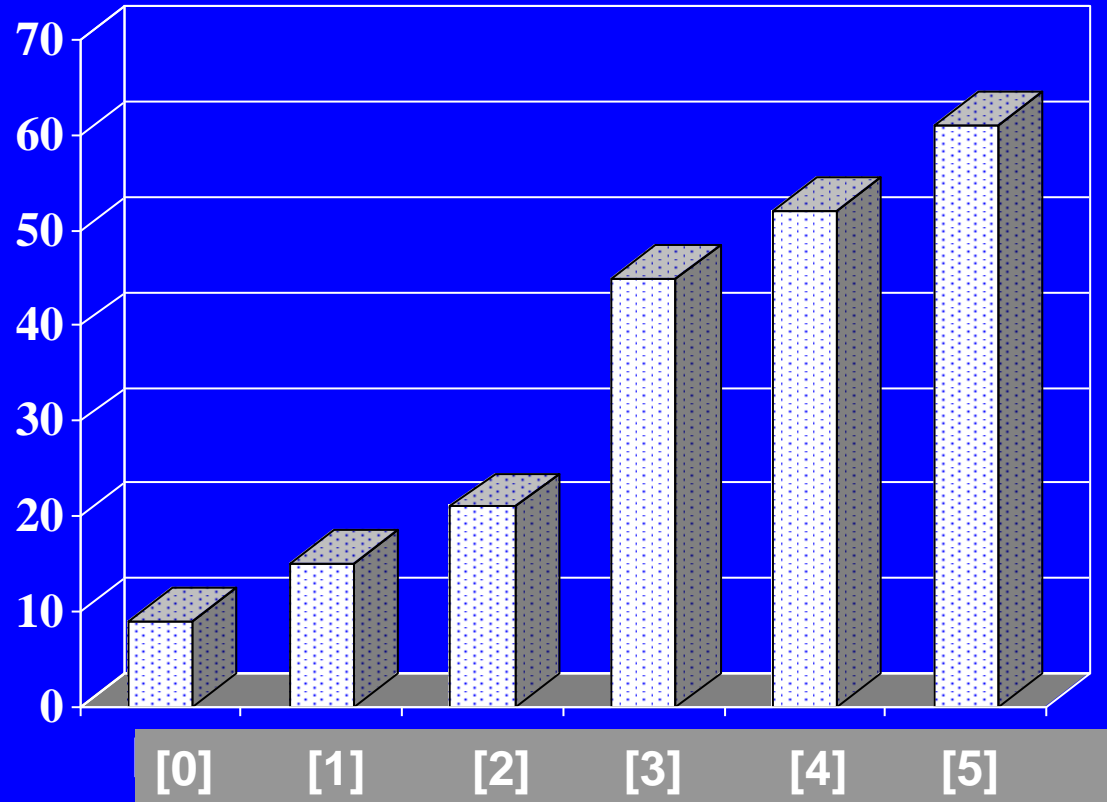
The Selection Sort Algorithm

- We can stop when the unsorted side has just one number, since that number must be the largest number.



The Selection Sort Algorithm

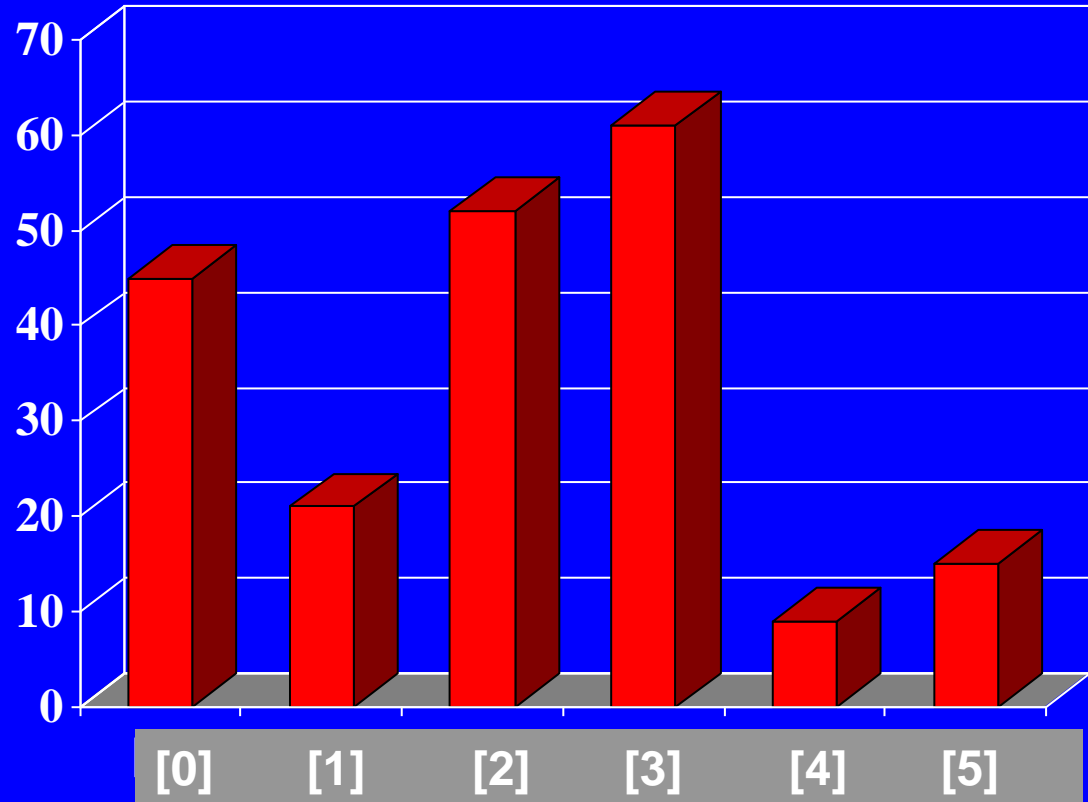
- The array is now sorted.
- We repeatedly selected the smallest element, and moved this element to the front of the unsorted side.



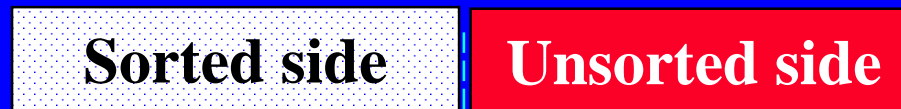
```
public static void selectionsort(int a[],int n)
{
    for(int i=0;i<n-1;i++)
    {
        int min=i;
        for(int j=i+1;j<n;j++)
        {
            if(a[j]<a[min])
                min=j;
        }
        int t=a[i];
        a[i]=a[min];
        a[min]=t;
    }
}
```

The Insertion Sort Algorithm

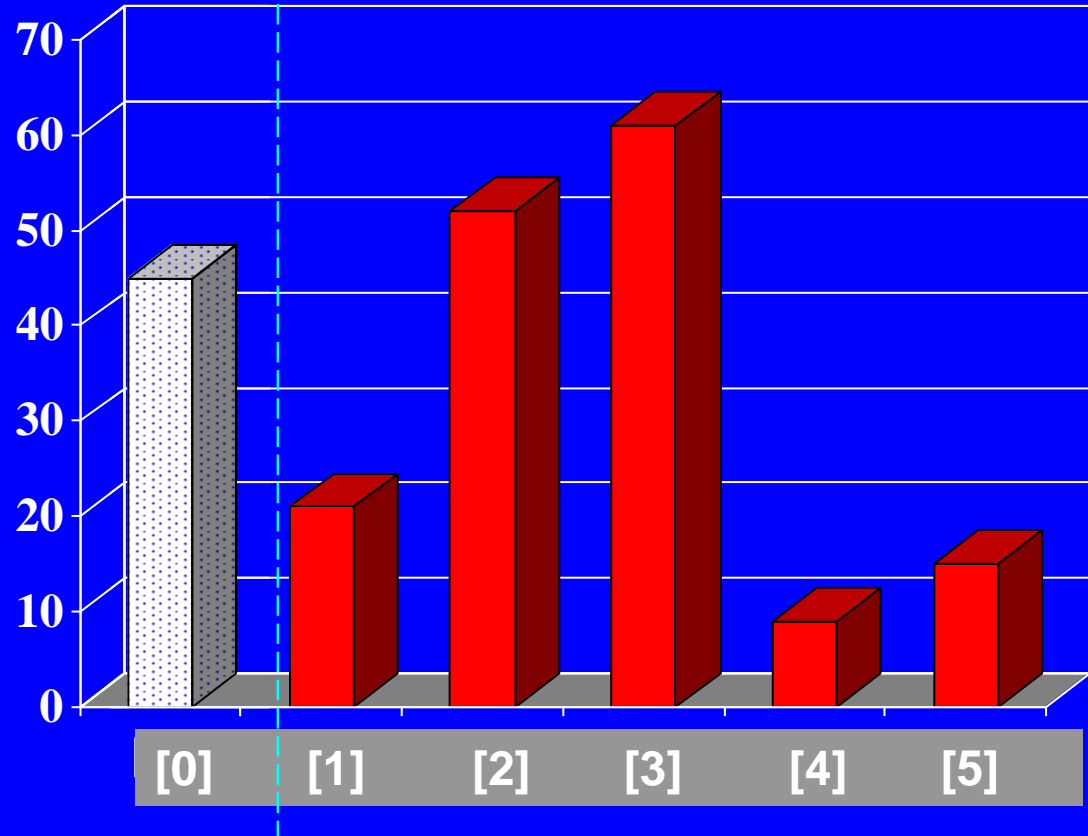
- The Insertion Sort algorithm also views the array as having a sorted side and an unsorted side.



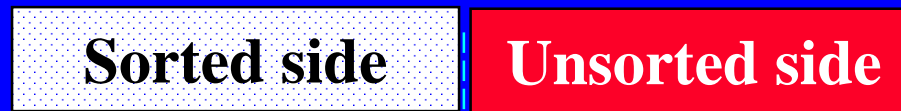
The Insertion Sort Algorithm



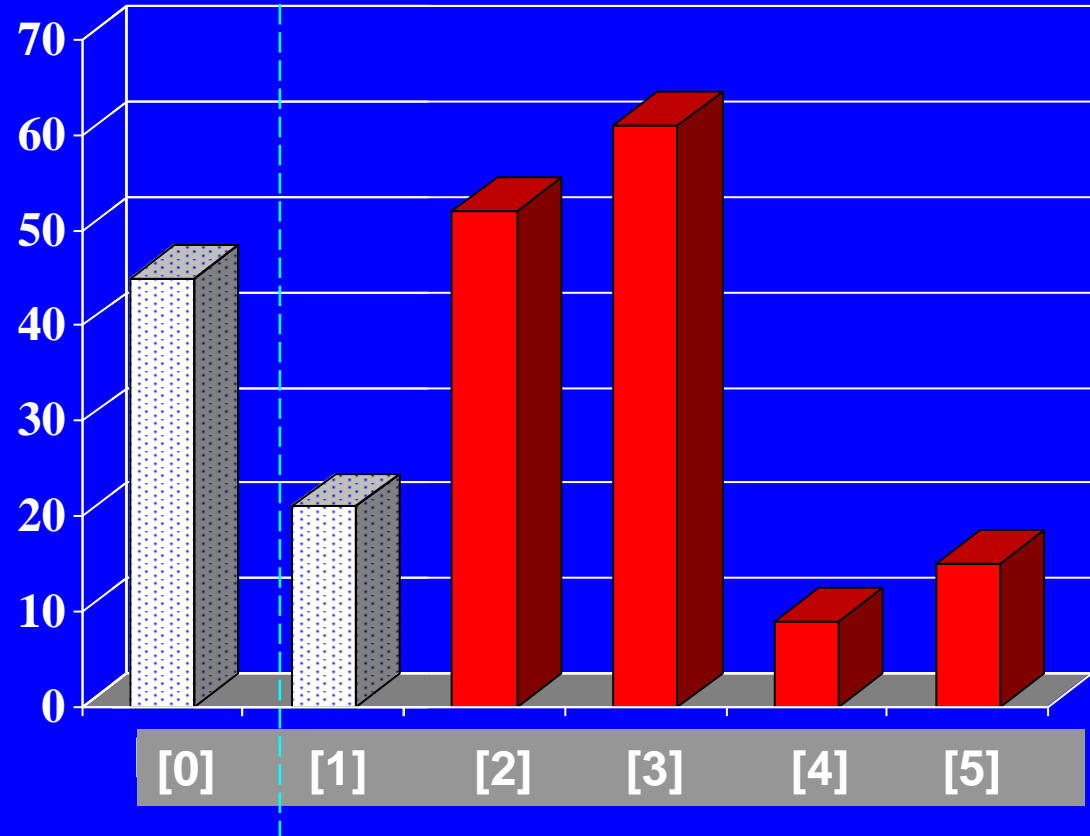
- The sorted side starts with just the first element, which is not necessarily the smallest element.



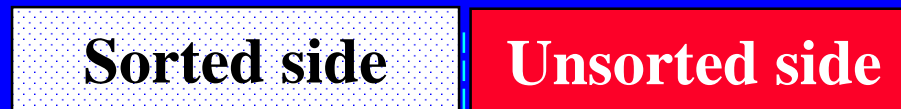
The Insertion Sort Algorithm



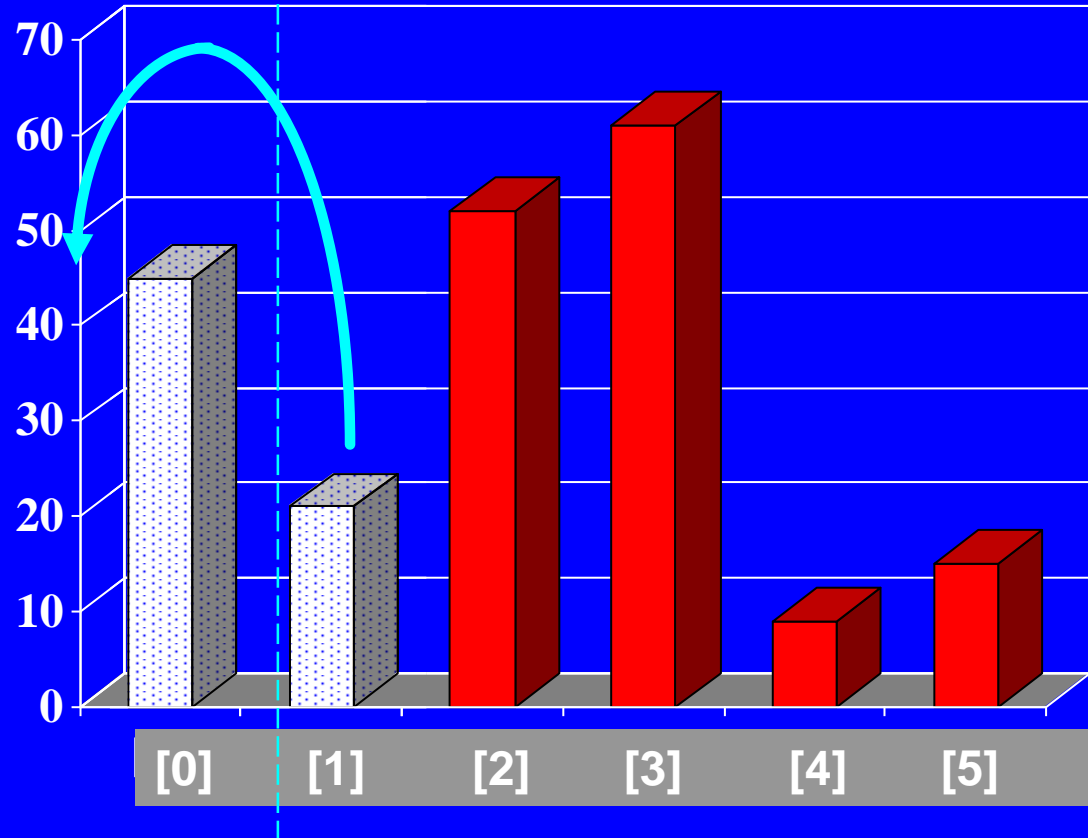
- The sorted side grows by taking the front element from the unsorted side...



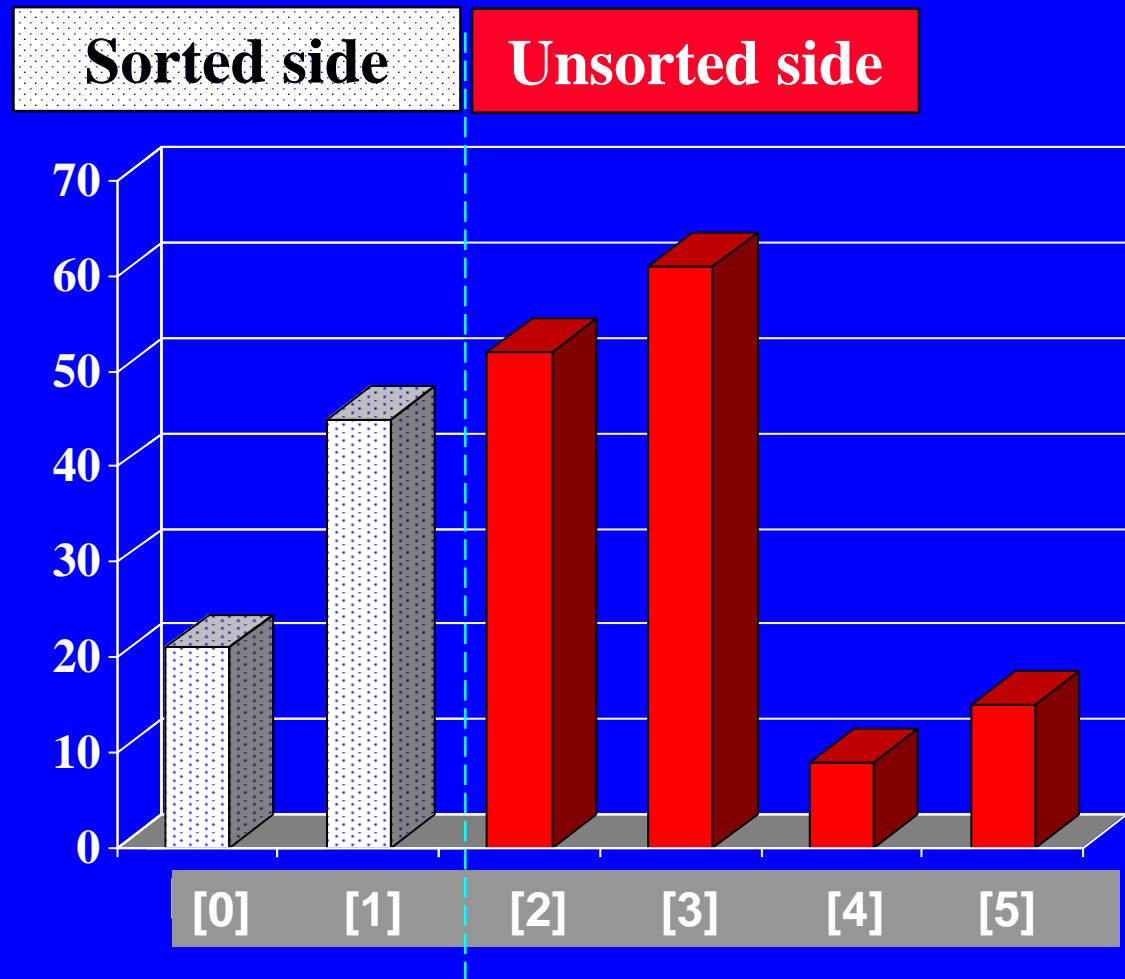
The Insertion Sort Algorithm



- ...and inserting it in the place that keeps the sorted side arranged from small to large.

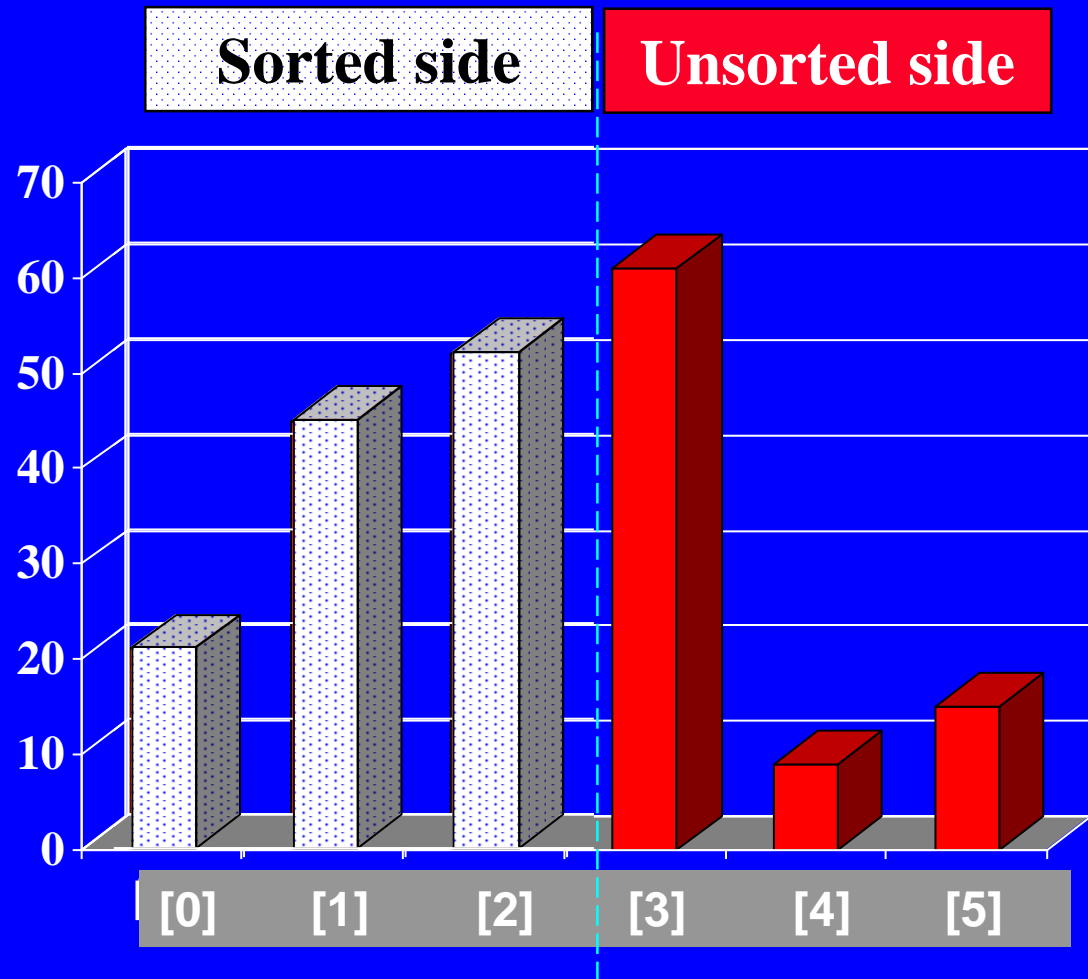


The Insertion Sort Algorithm



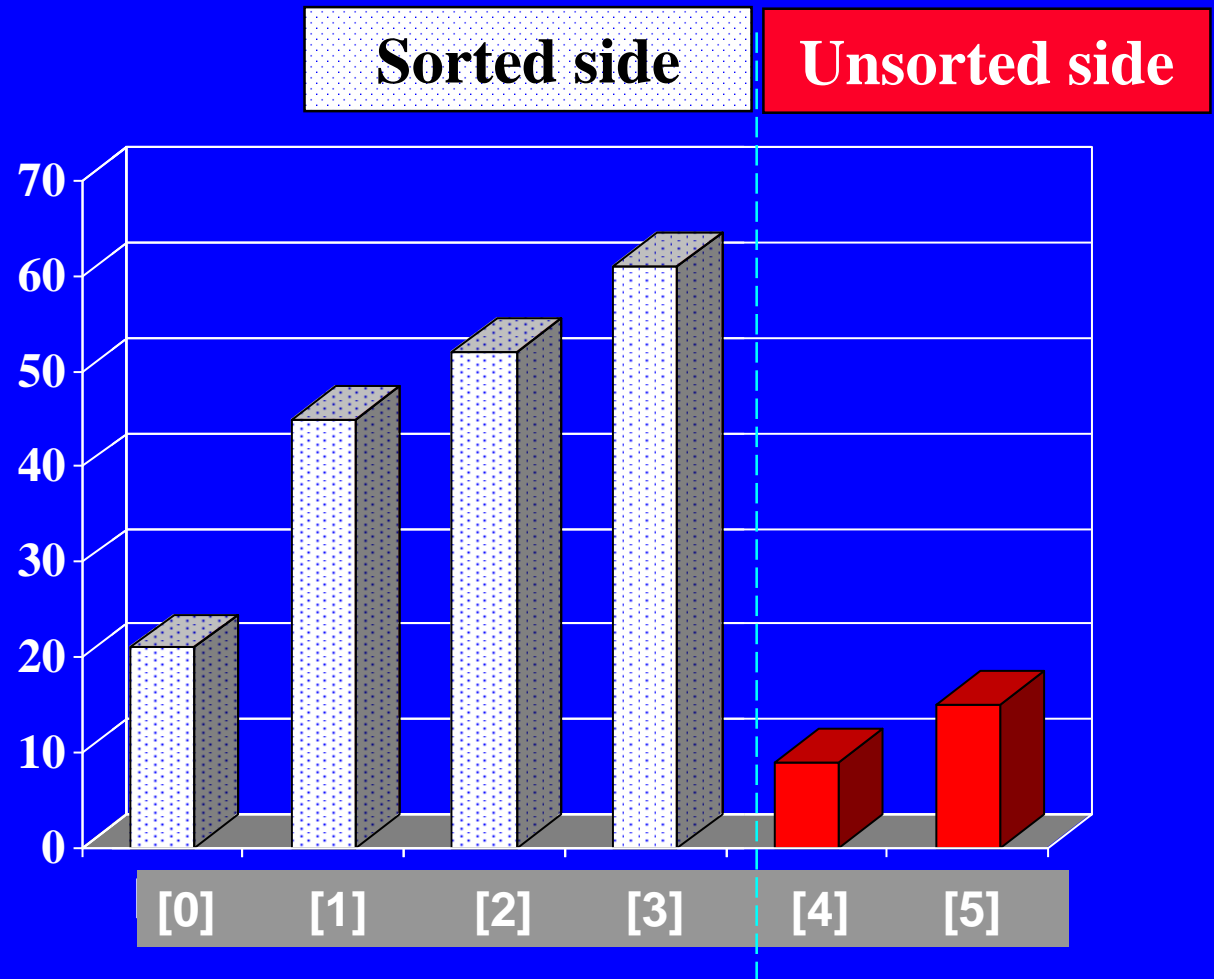
The Insertion Sort Algorithm

- Sometimes we are lucky and the new inserted item doesn't need to move at all.



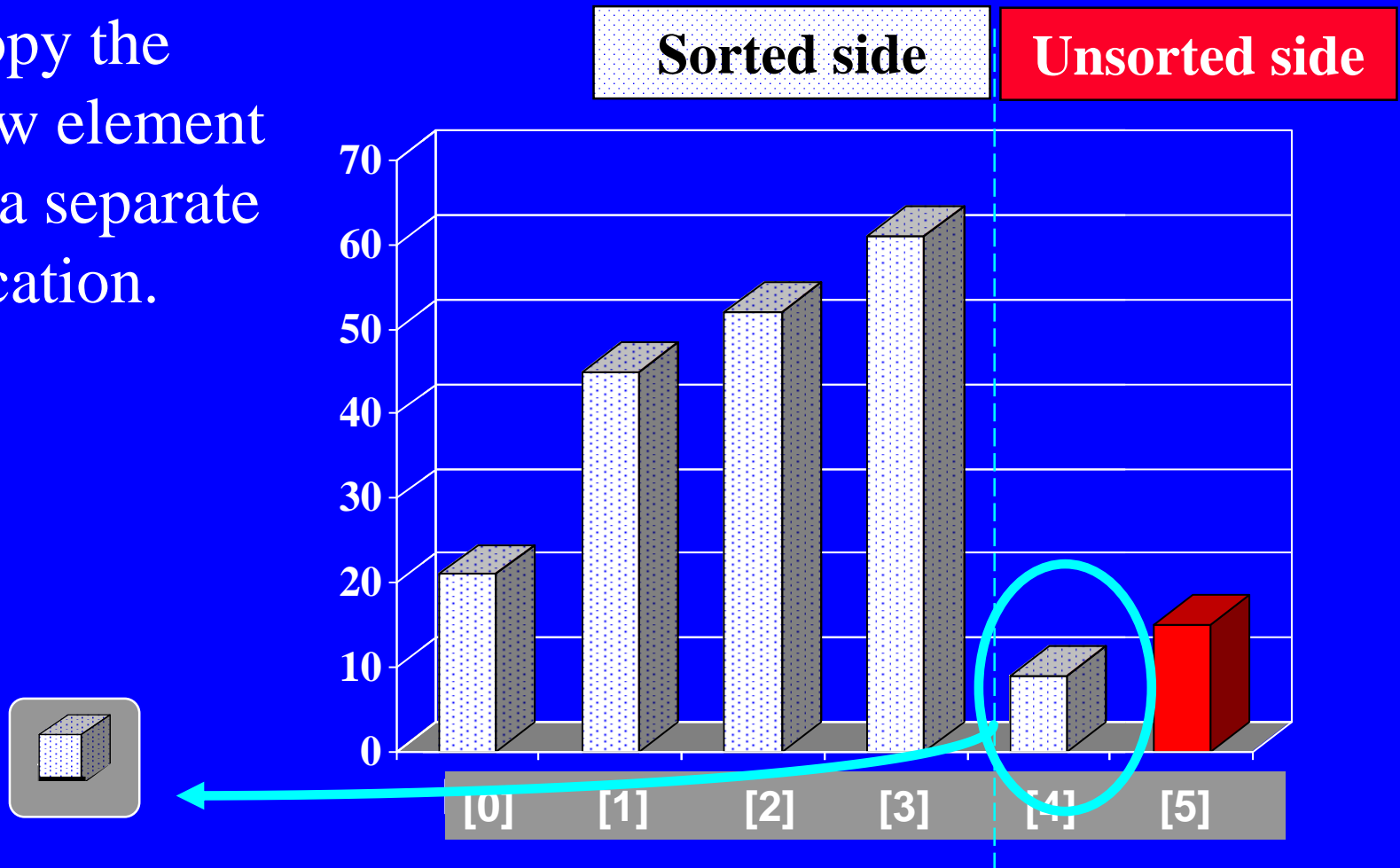
The Insertionsort Algorithm

- Sometimes we are lucky twice in a row.



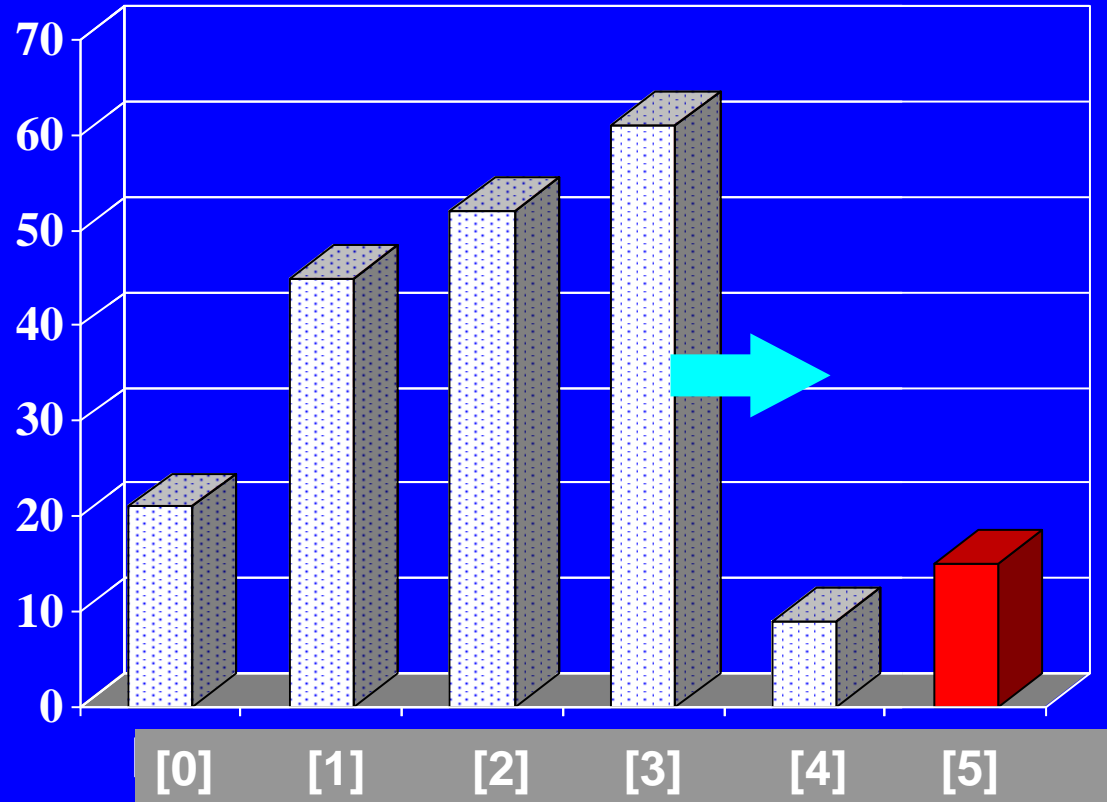
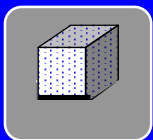
How to Insert One Element

- ☆ Copy the new element to a separate location.



How to Insert One Element

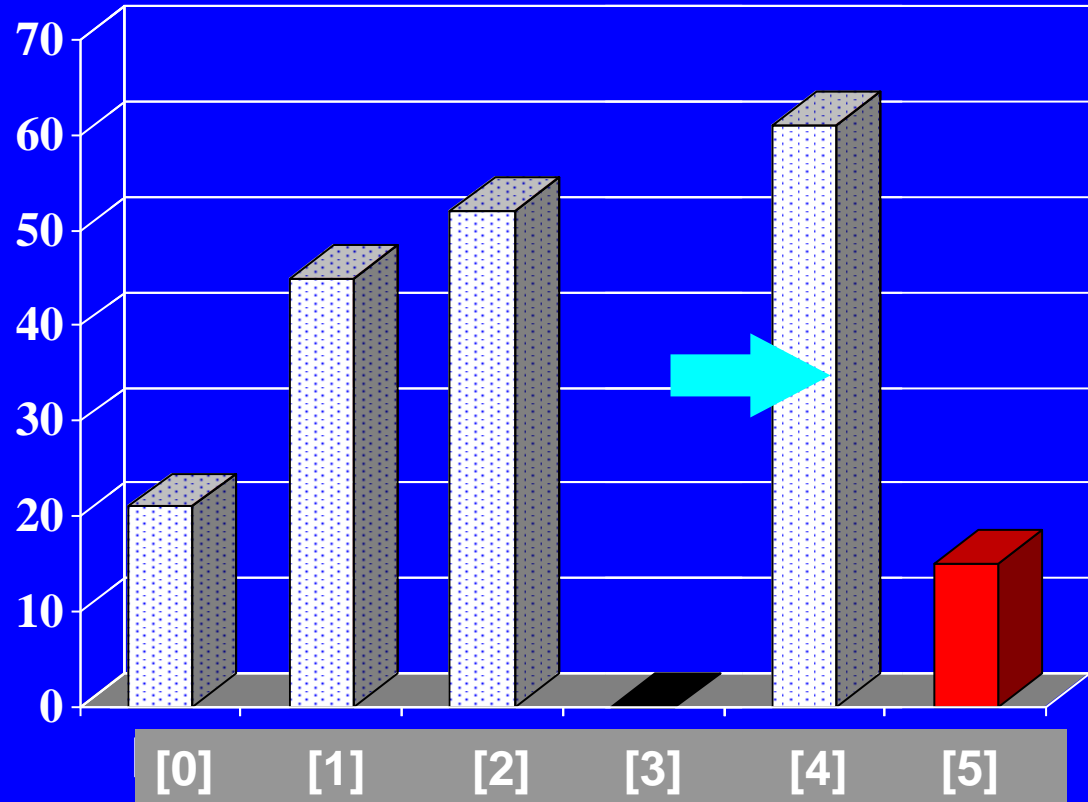
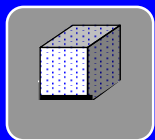
⌚ Shift
elements in
the sorted
side,
creating an
open space
for the new
element.



How to Insert One Element

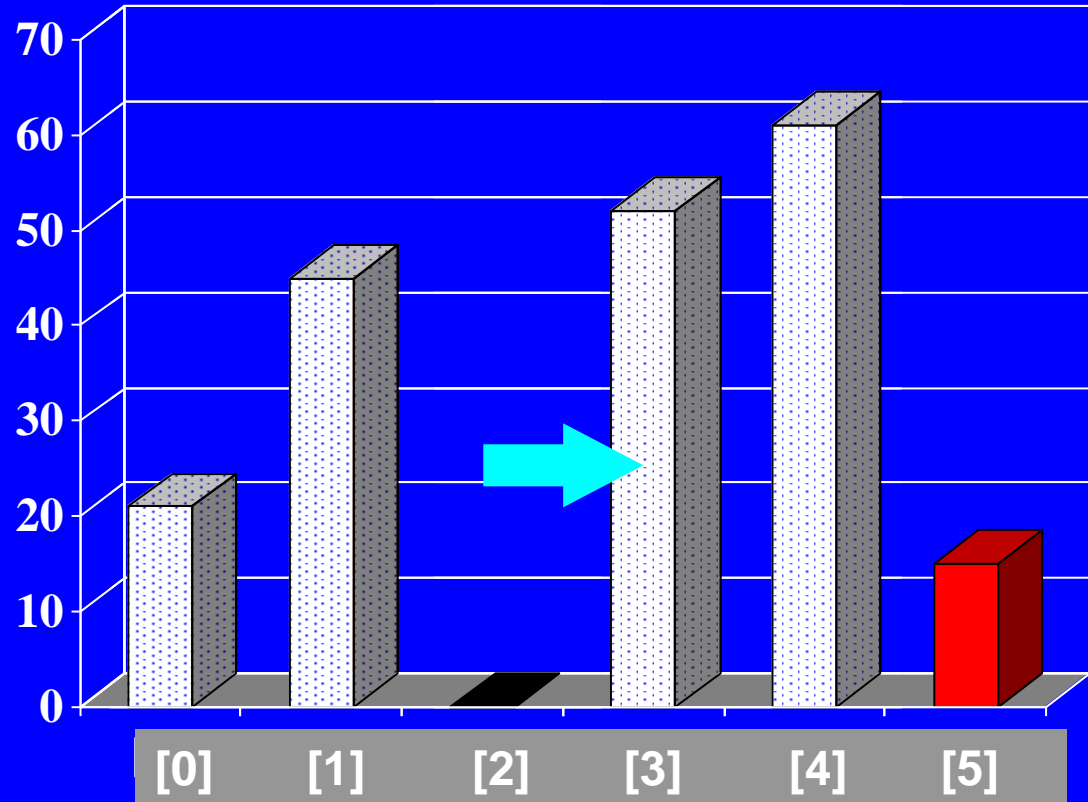
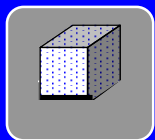
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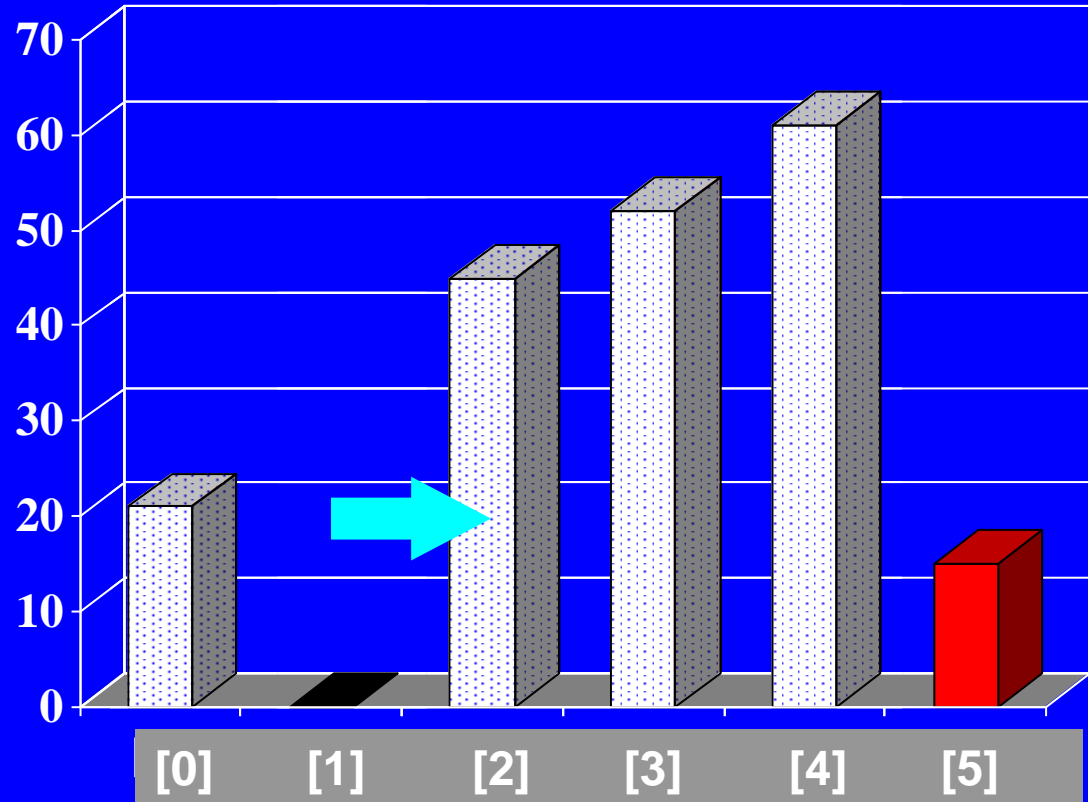
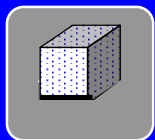
How to Insert One Element

⌚ Continue
shifting
elements...



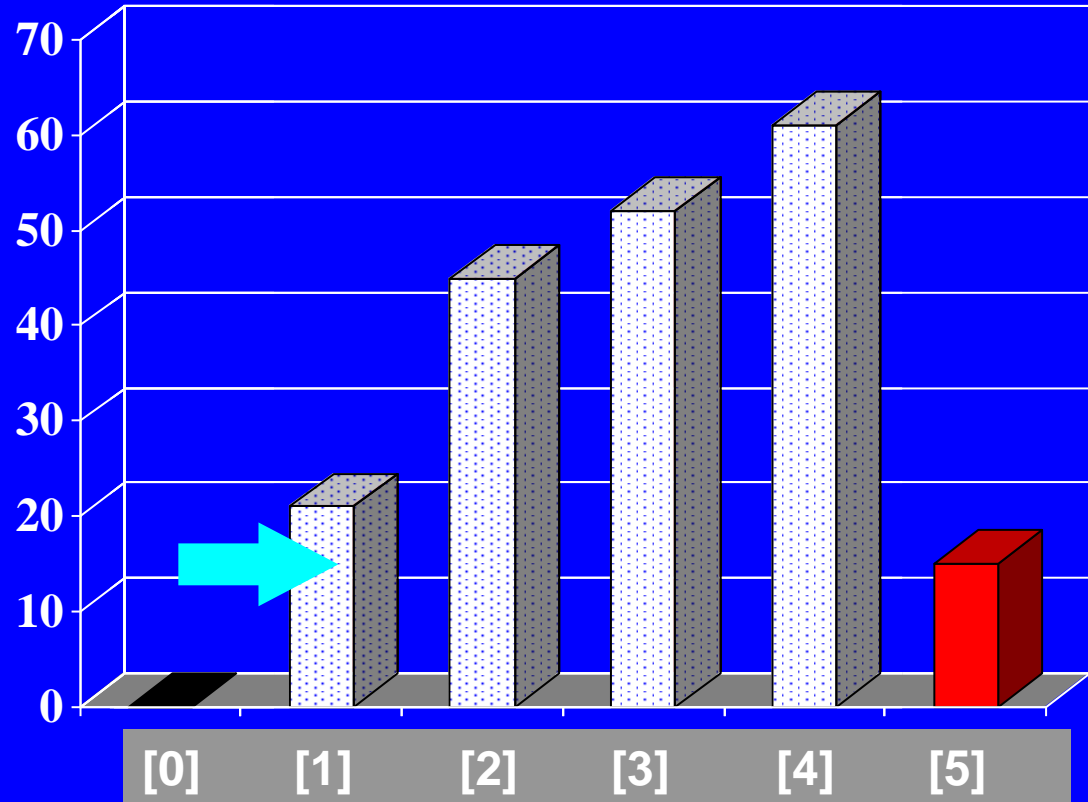
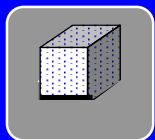
How to Insert One Element

⌚ Continue
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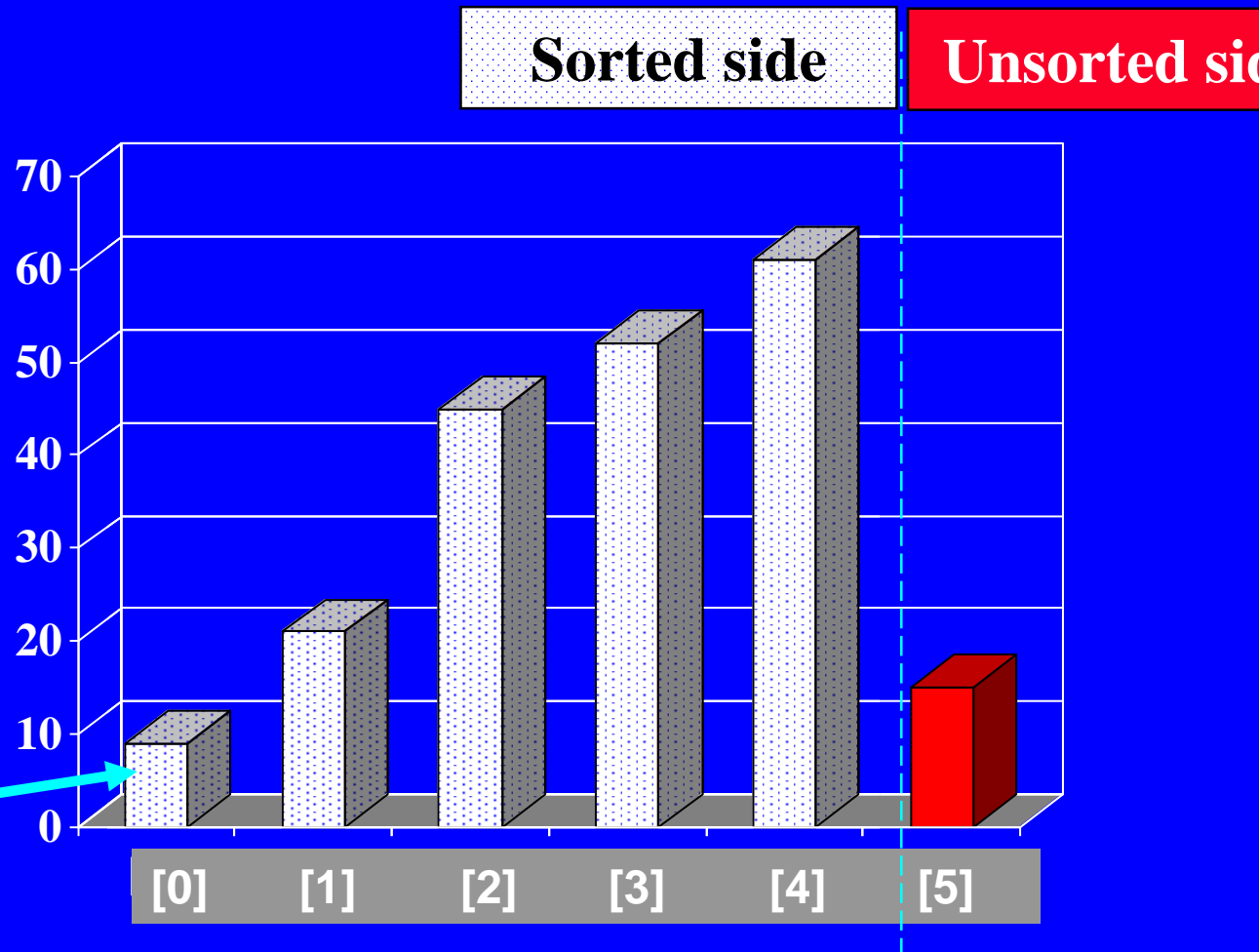
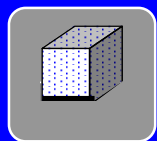
How to Insert One Element

⌚ ...until you reach the location for the new element.



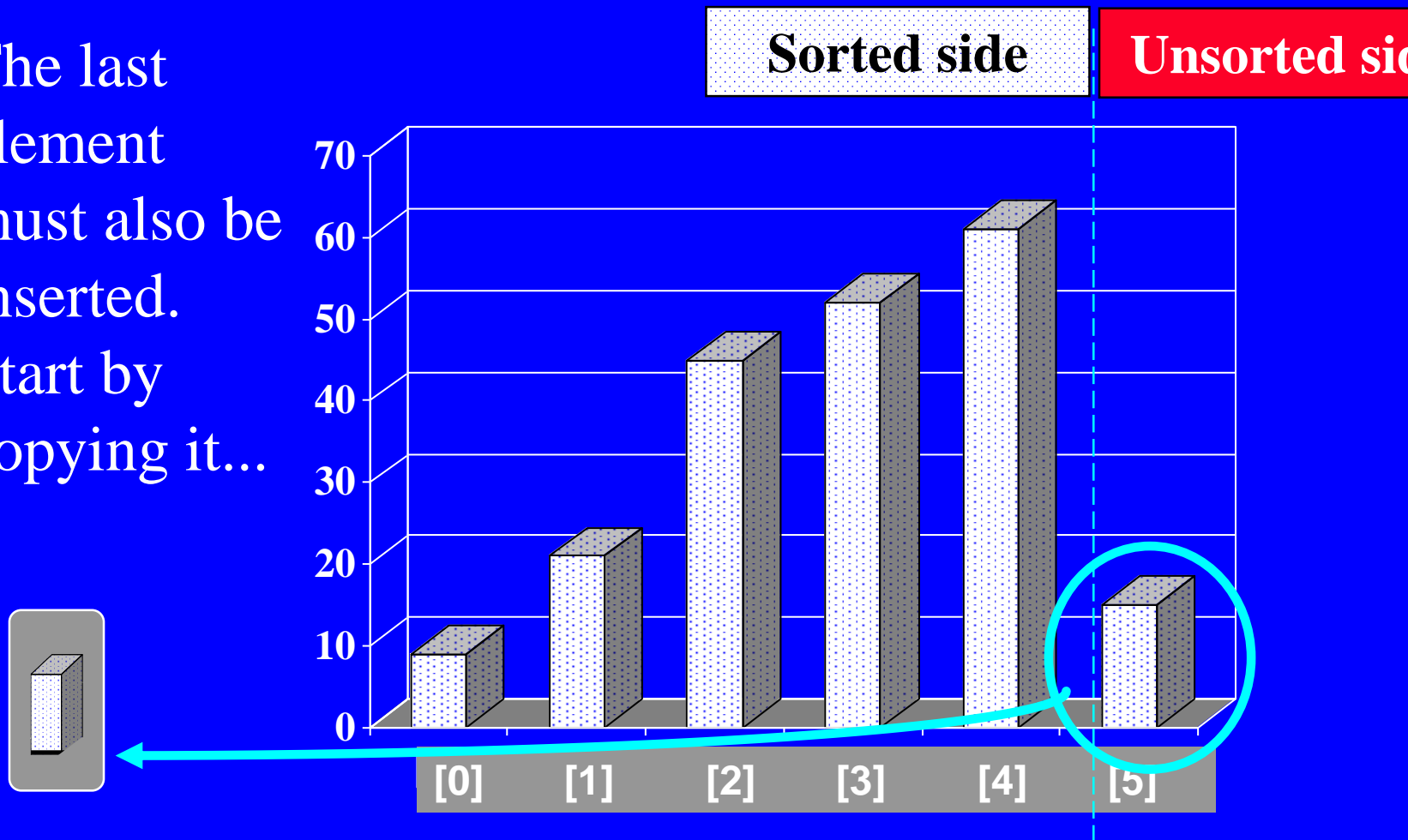
How to Insert One Element

- ⌚ Copy the new element back into the array, at the correct location.

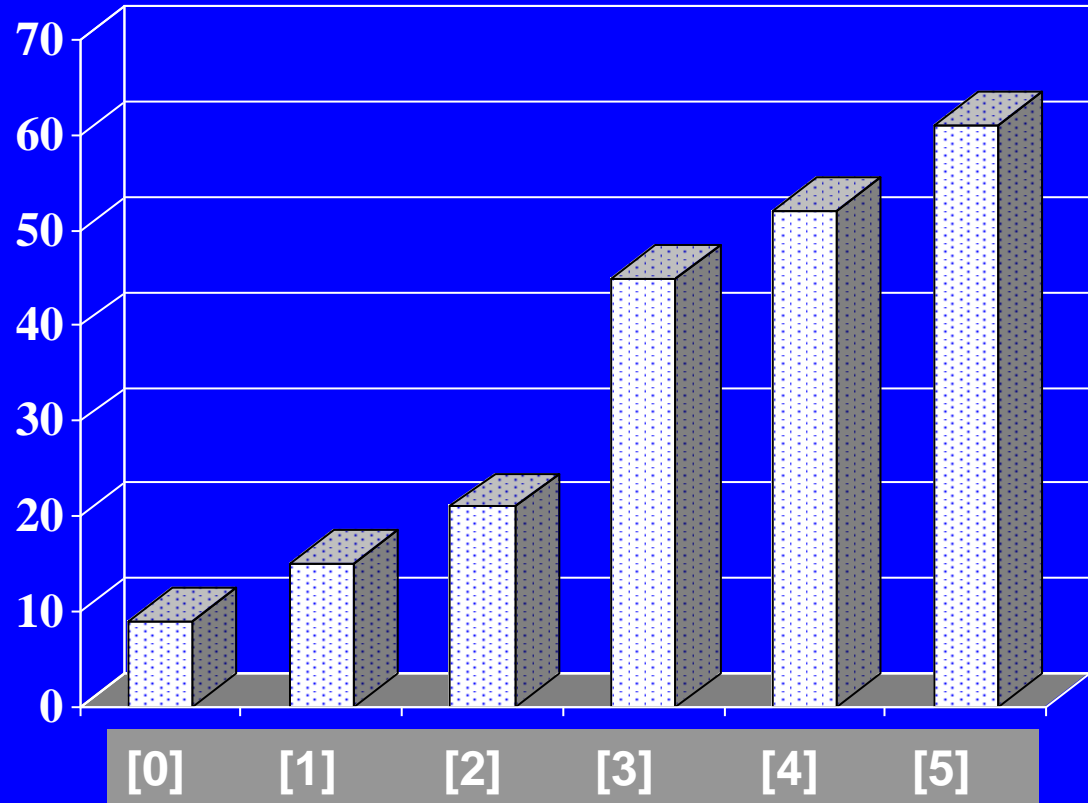


How to Insert One Element

- The last element must also be inserted. Start by copying it...



Sorted Result

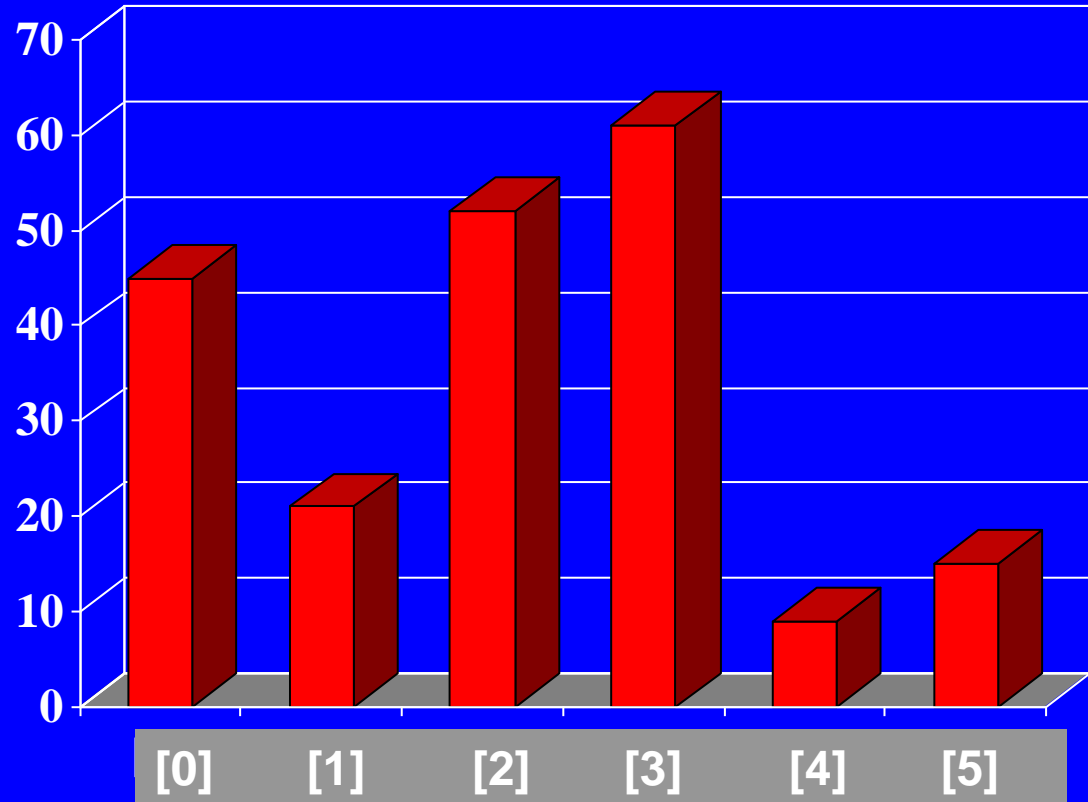


```
public static void insertionsort(int a[],int n)
{
    int space,value;

    for(int i=1;i<n;i++)
    {
        value = a[i];
        space = i;
        while(space>0 && a[space-1]>value)
        {
            a[space]=a[space-1];
            space = space-1;
        }
        a[space]=value;
    }
}
```

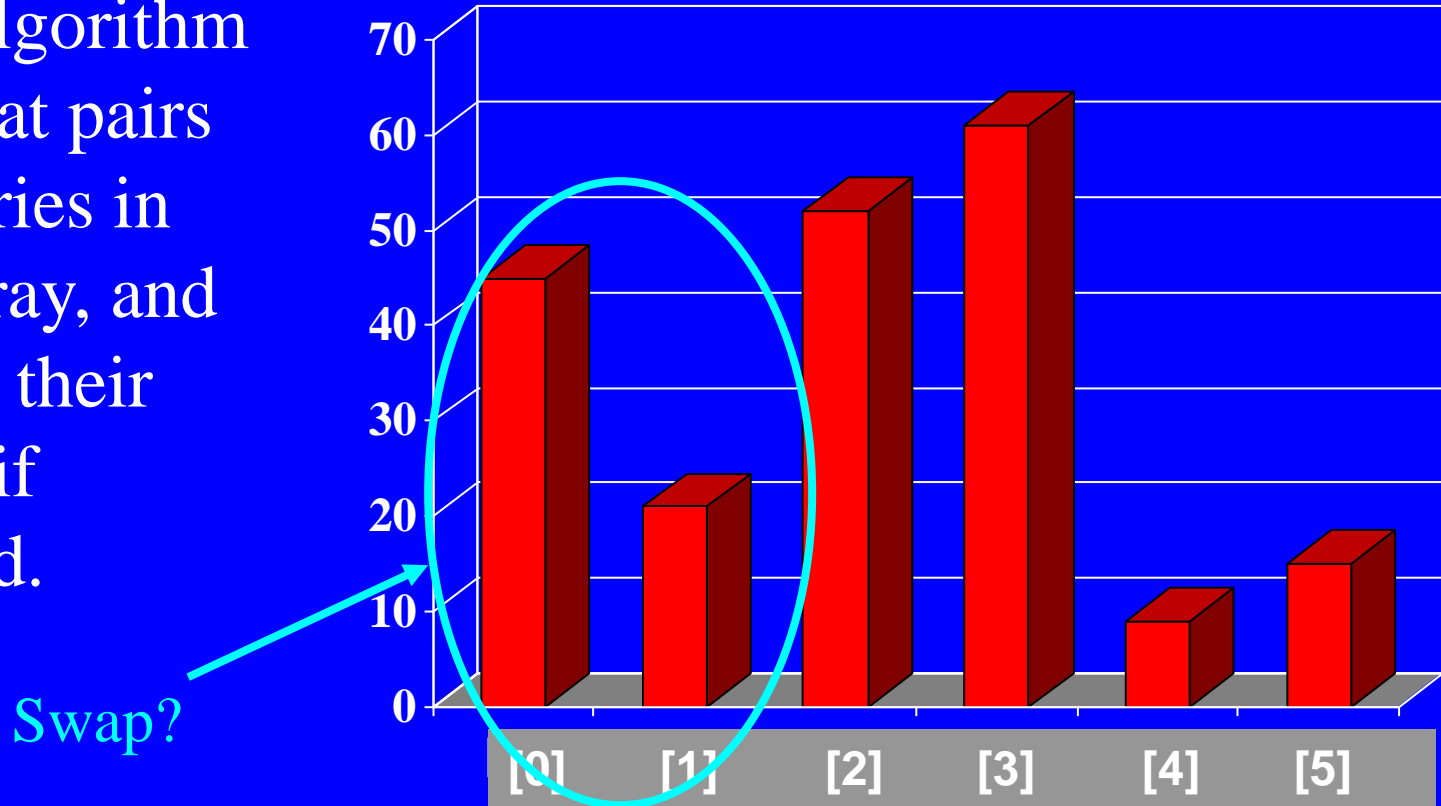
The Bubble Sort Algorithm

- The Bubble Sort algorithm looks at pairs of entries in the array, and swaps their order if needed.



The Bubble Sort Algorithm

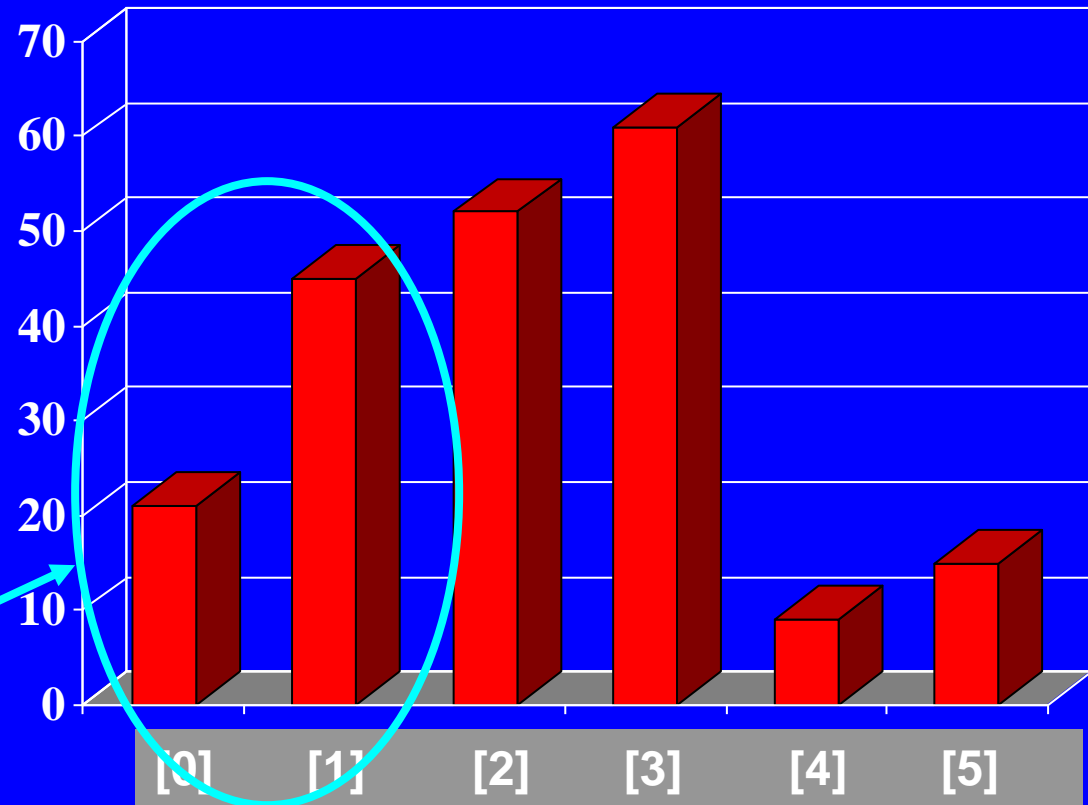
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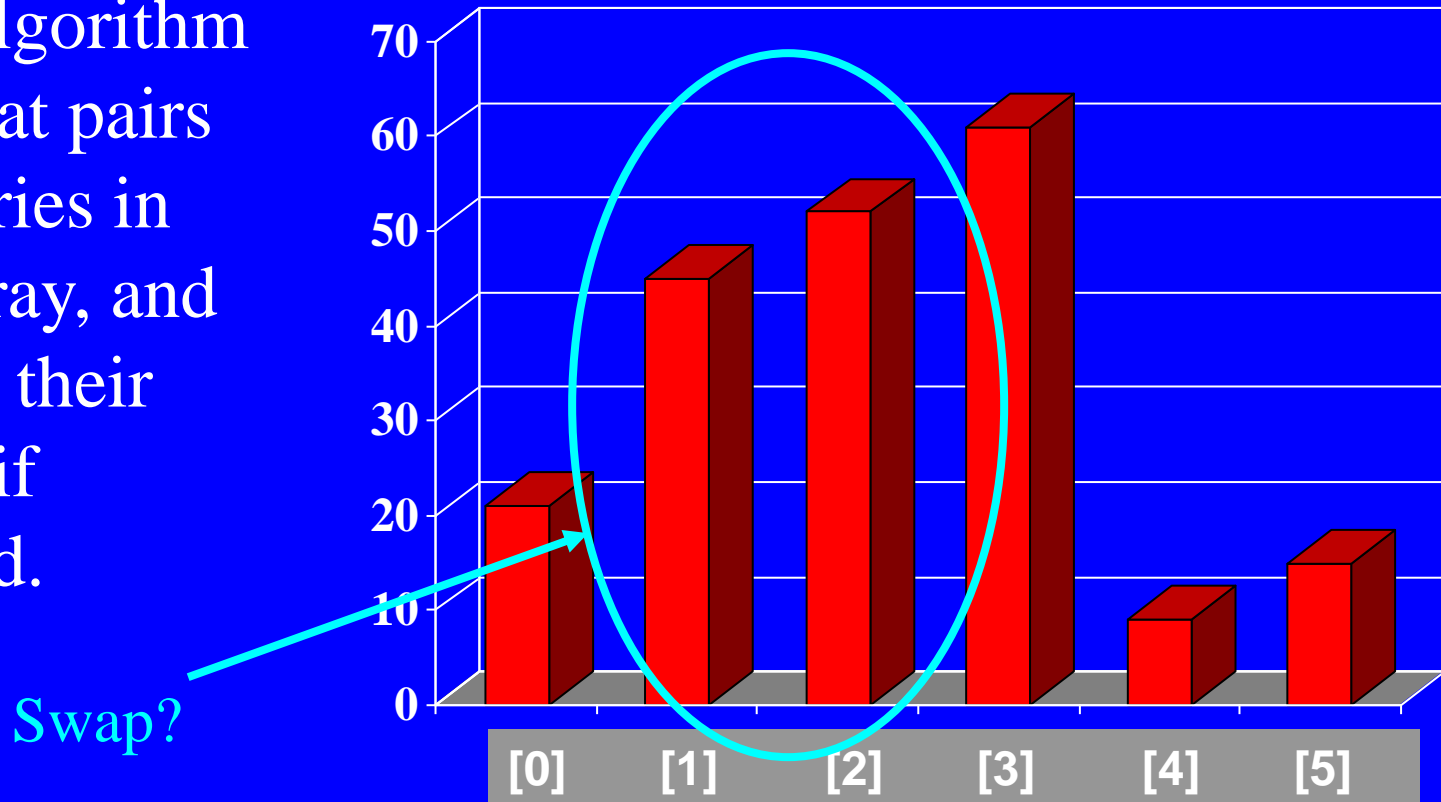
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Yes!



The Bubble Sort Algorithm

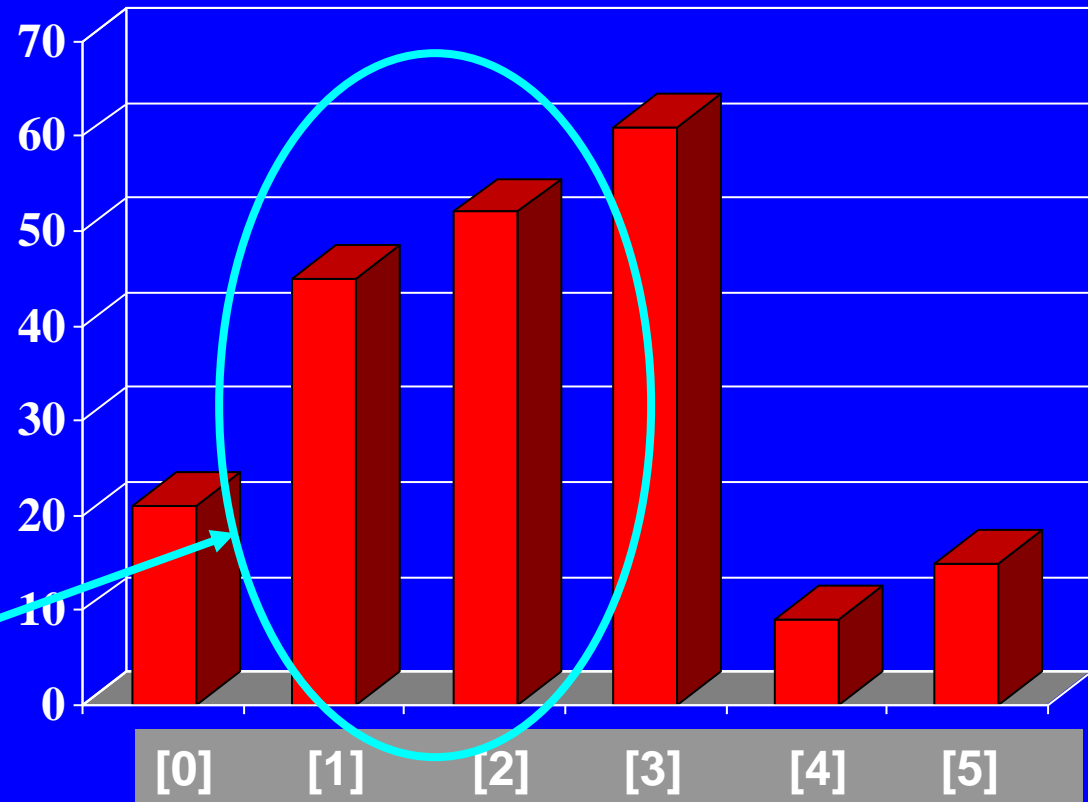
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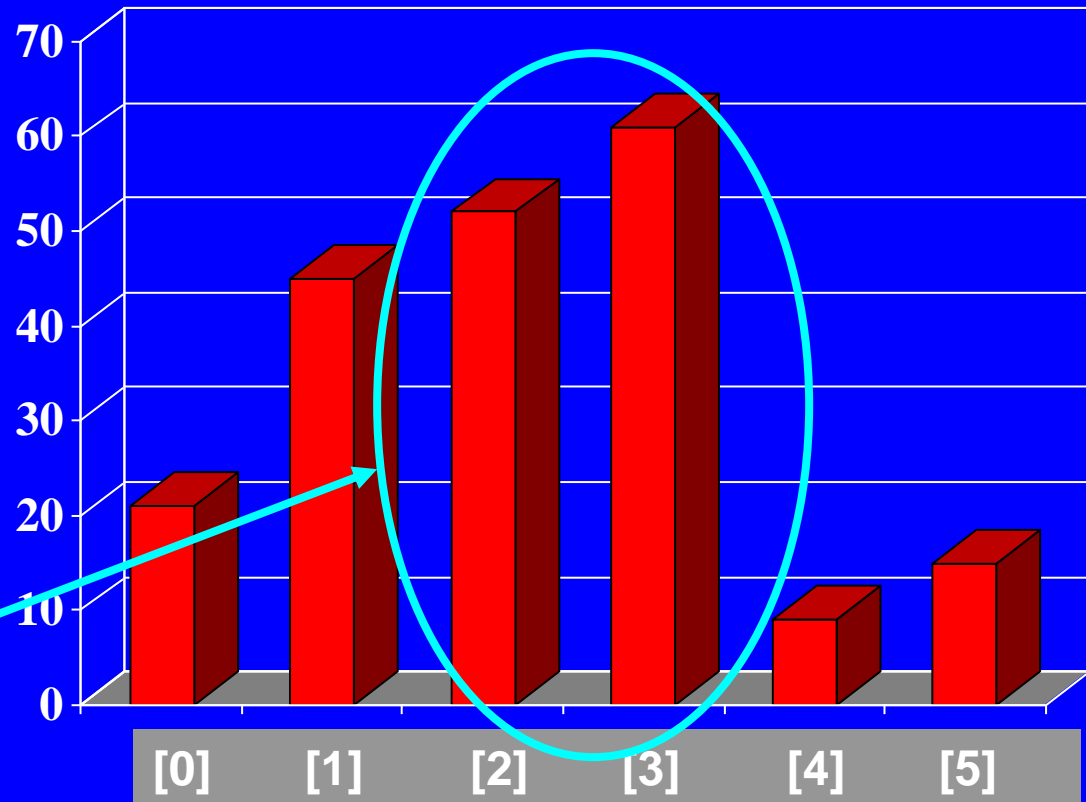
No.



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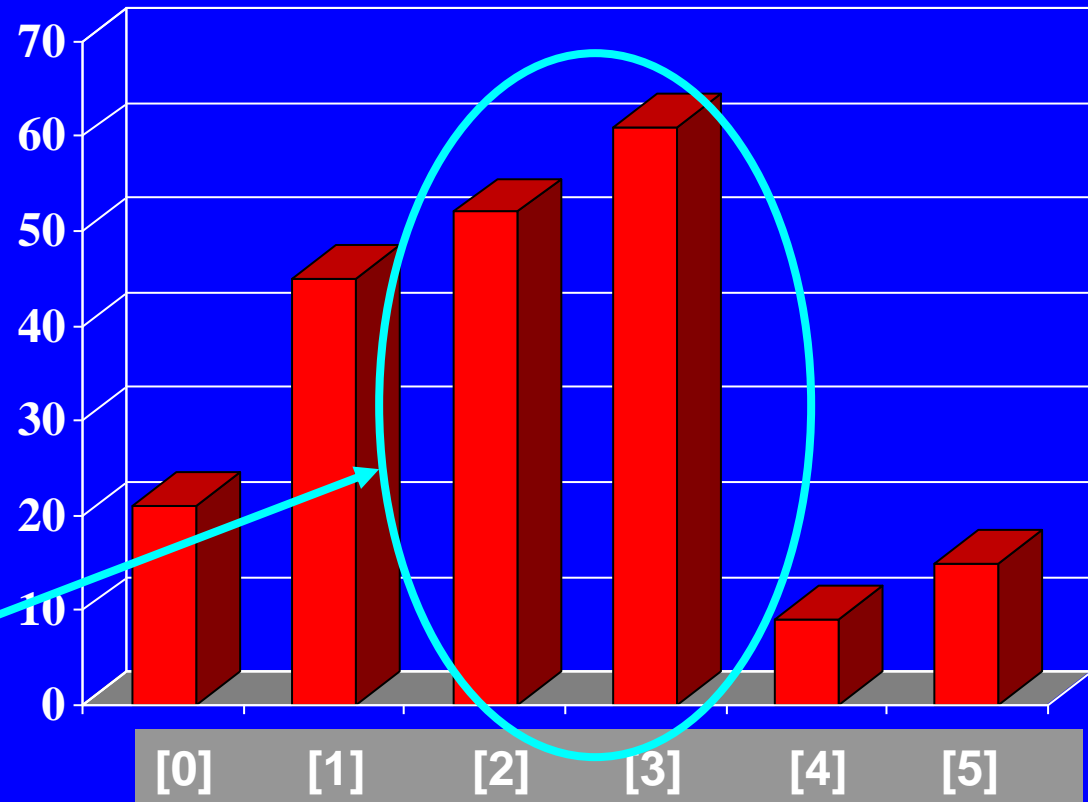
Swap?



The Bubble Sort Algorithm

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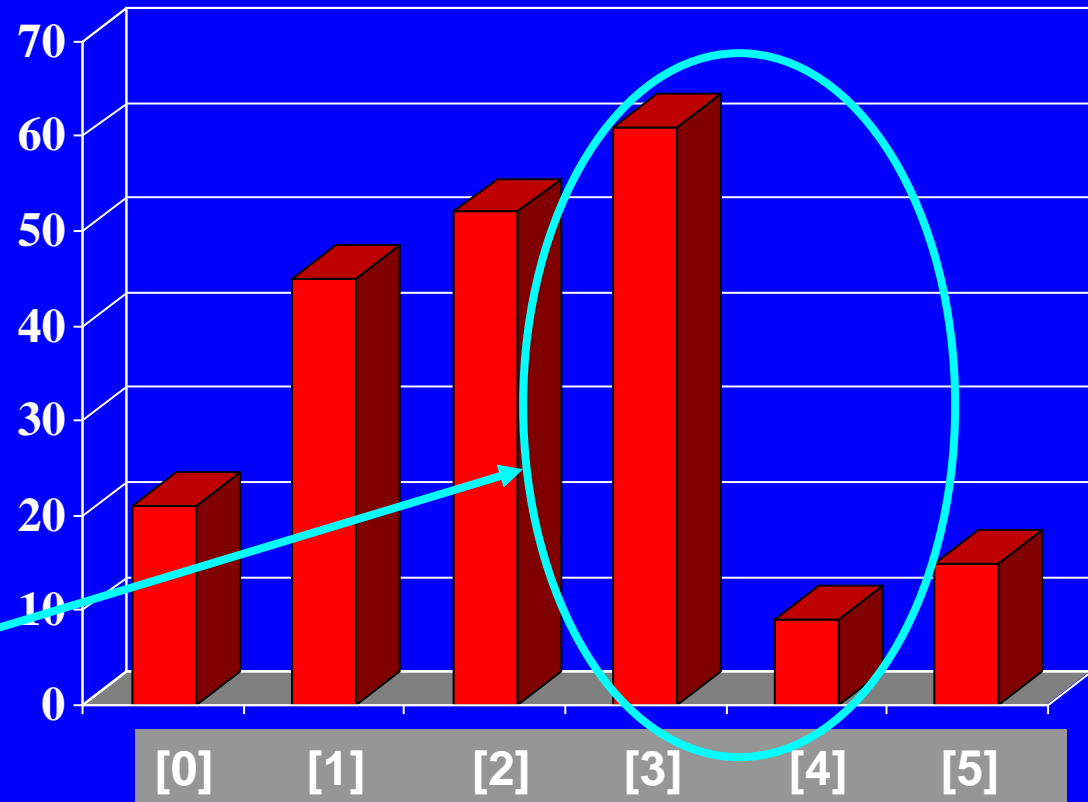
No.



The Bubble Sort Algorithm

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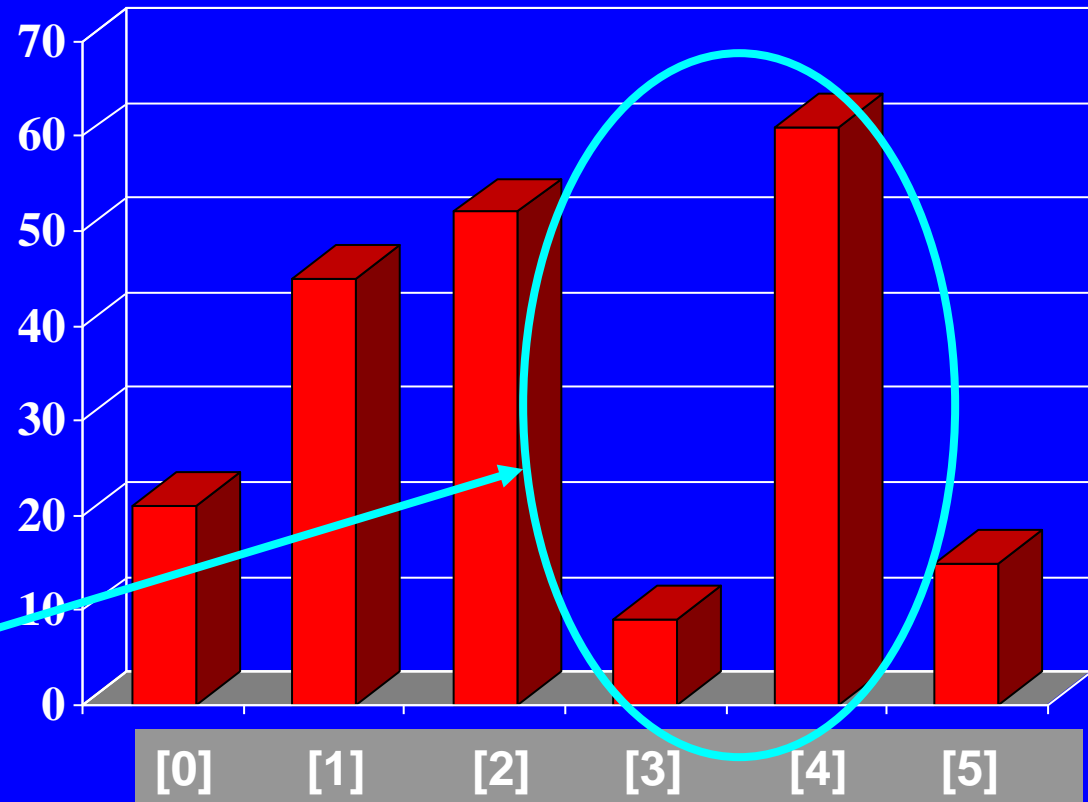
Swap?



The Bubble Sort Algorithm

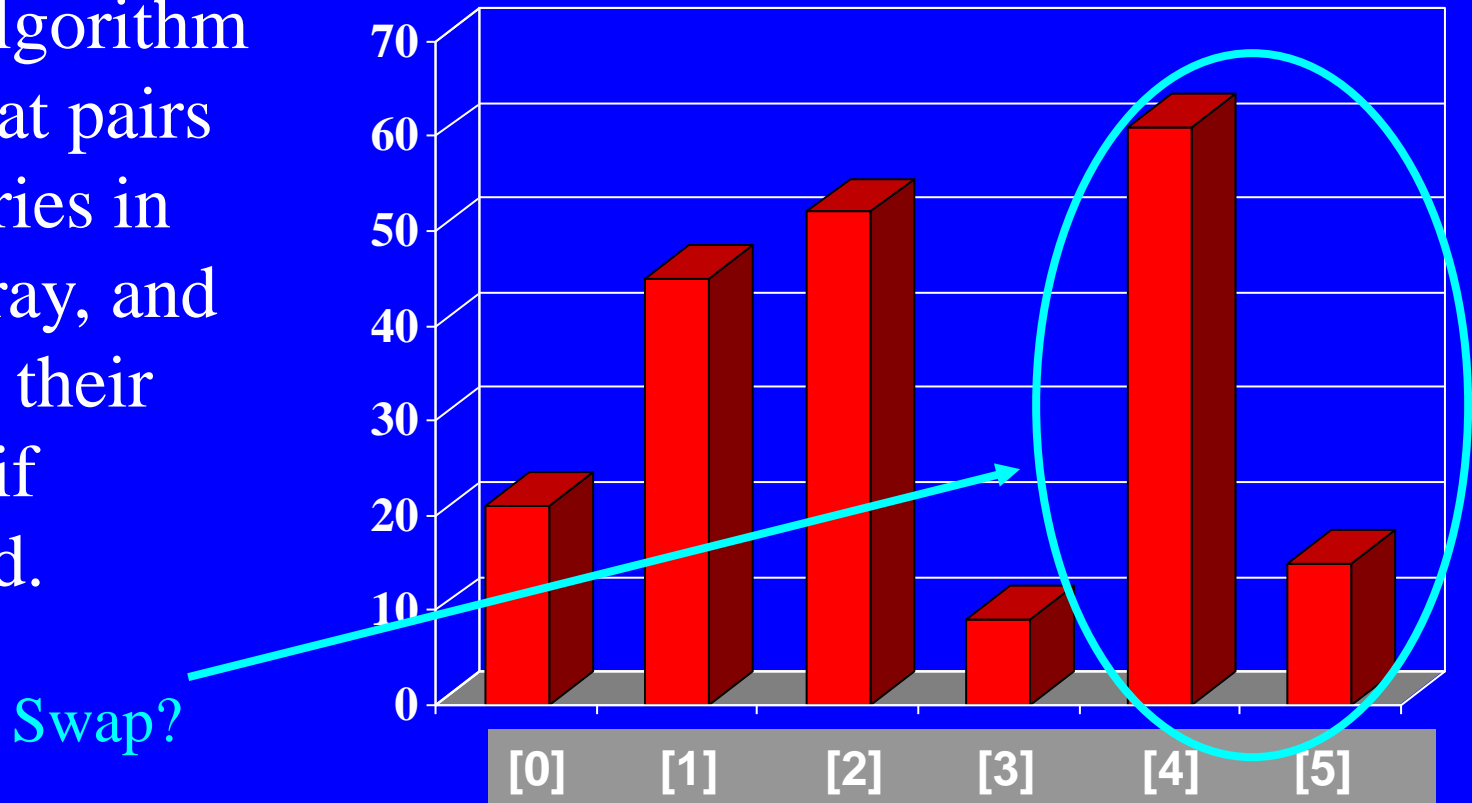
- The Bubble Sort algorithm looks at pairs of entries in the array, and swaps their order if needed.

Yes!



The Bubble Sort Algorithm

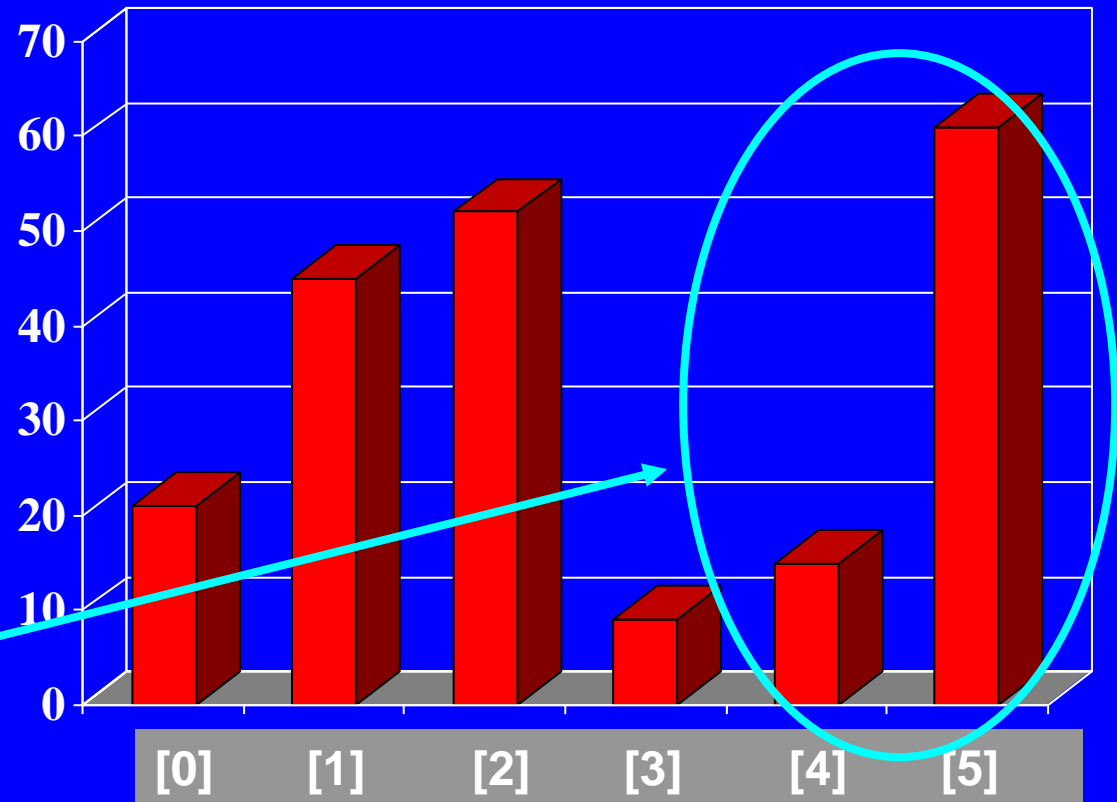
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The Bubble Sort Algorithm

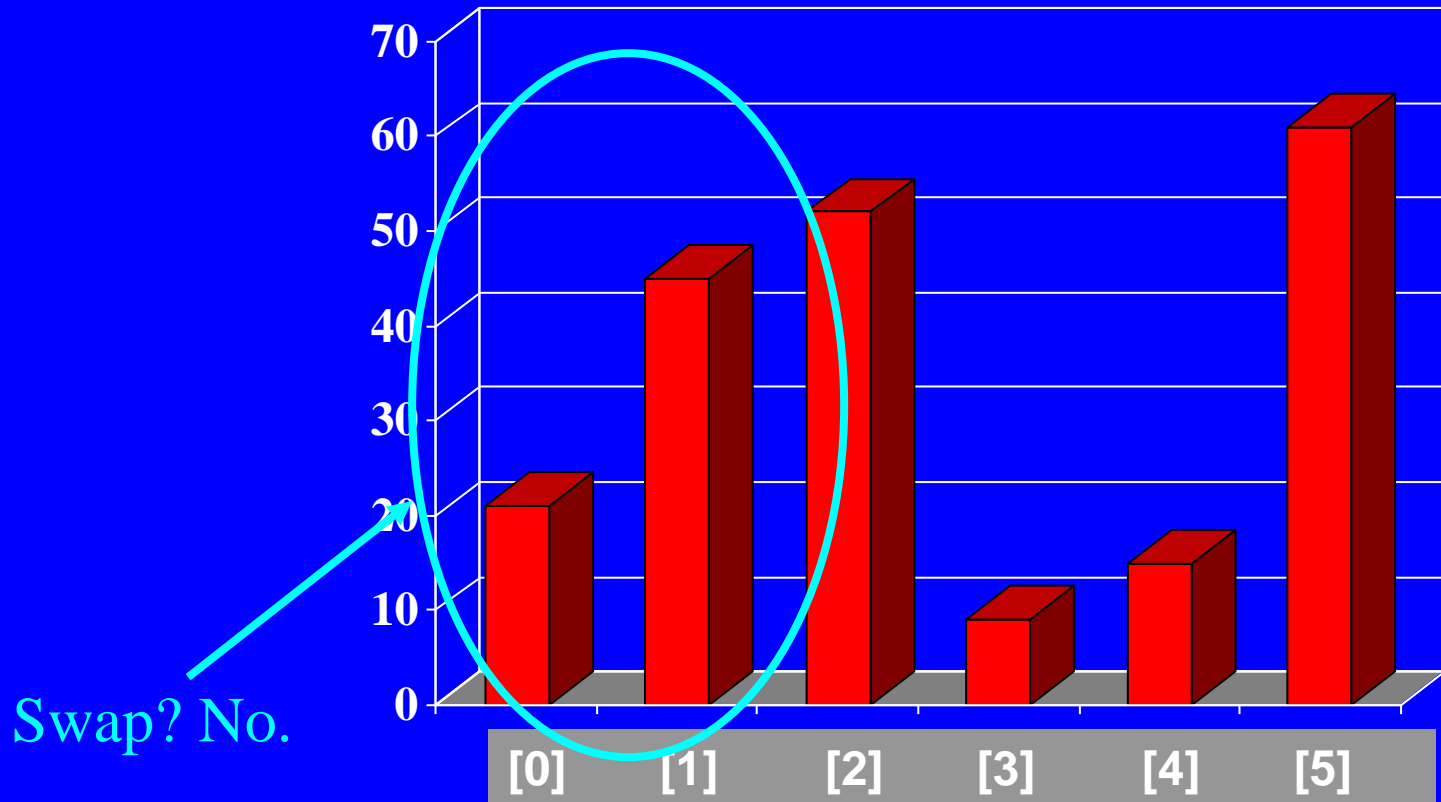
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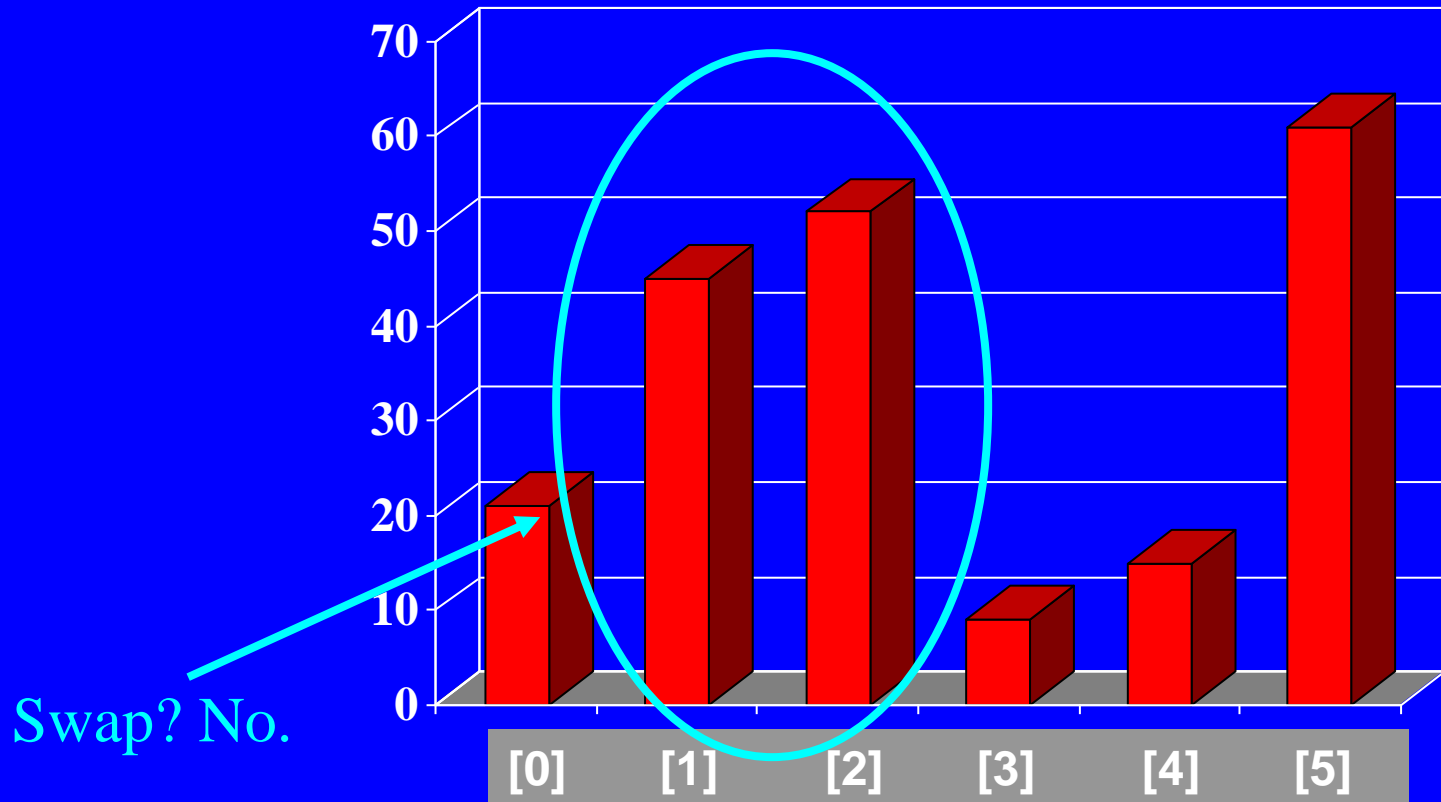
The Bubble Sort Algorithm

- Repeat.



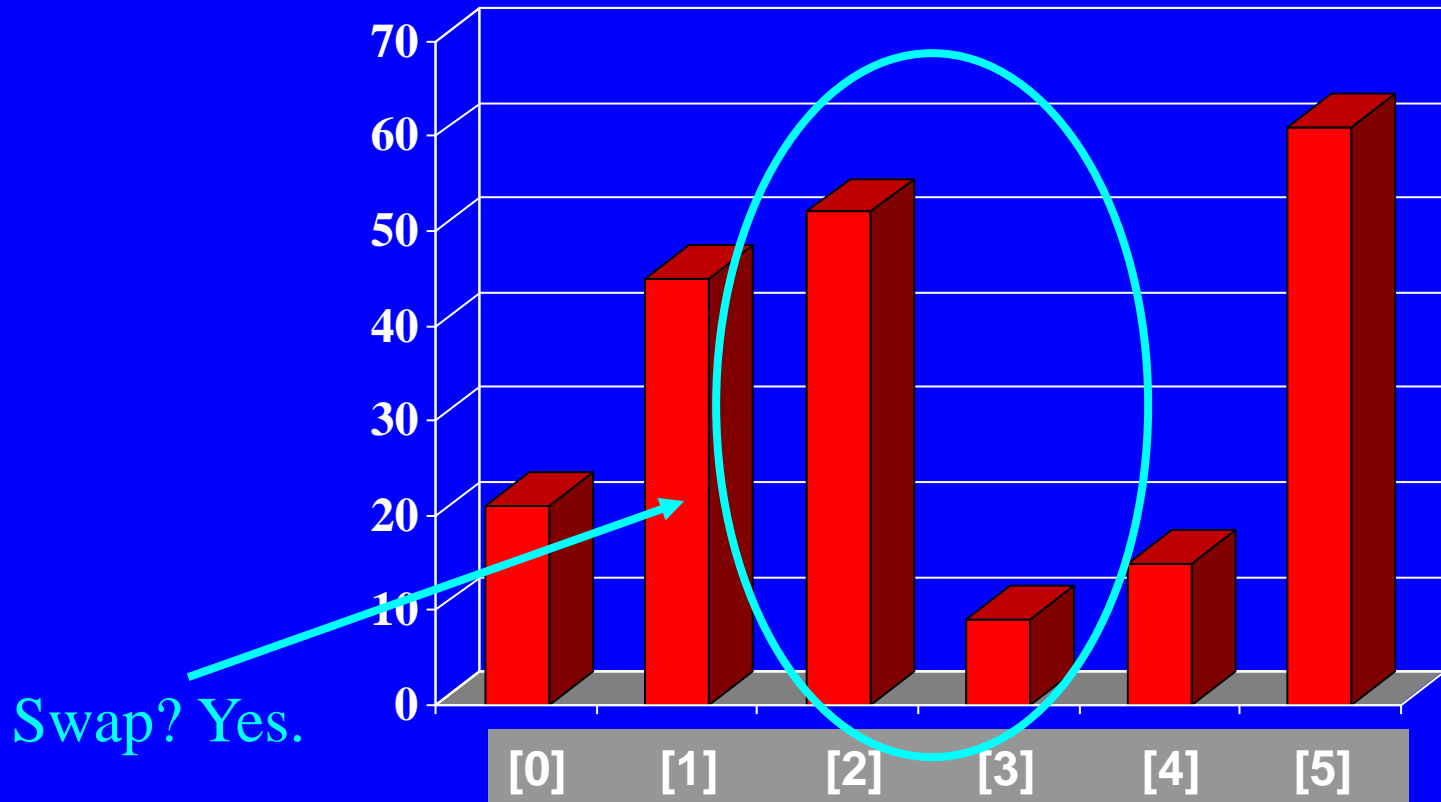
The Bubble Sort Algorithm

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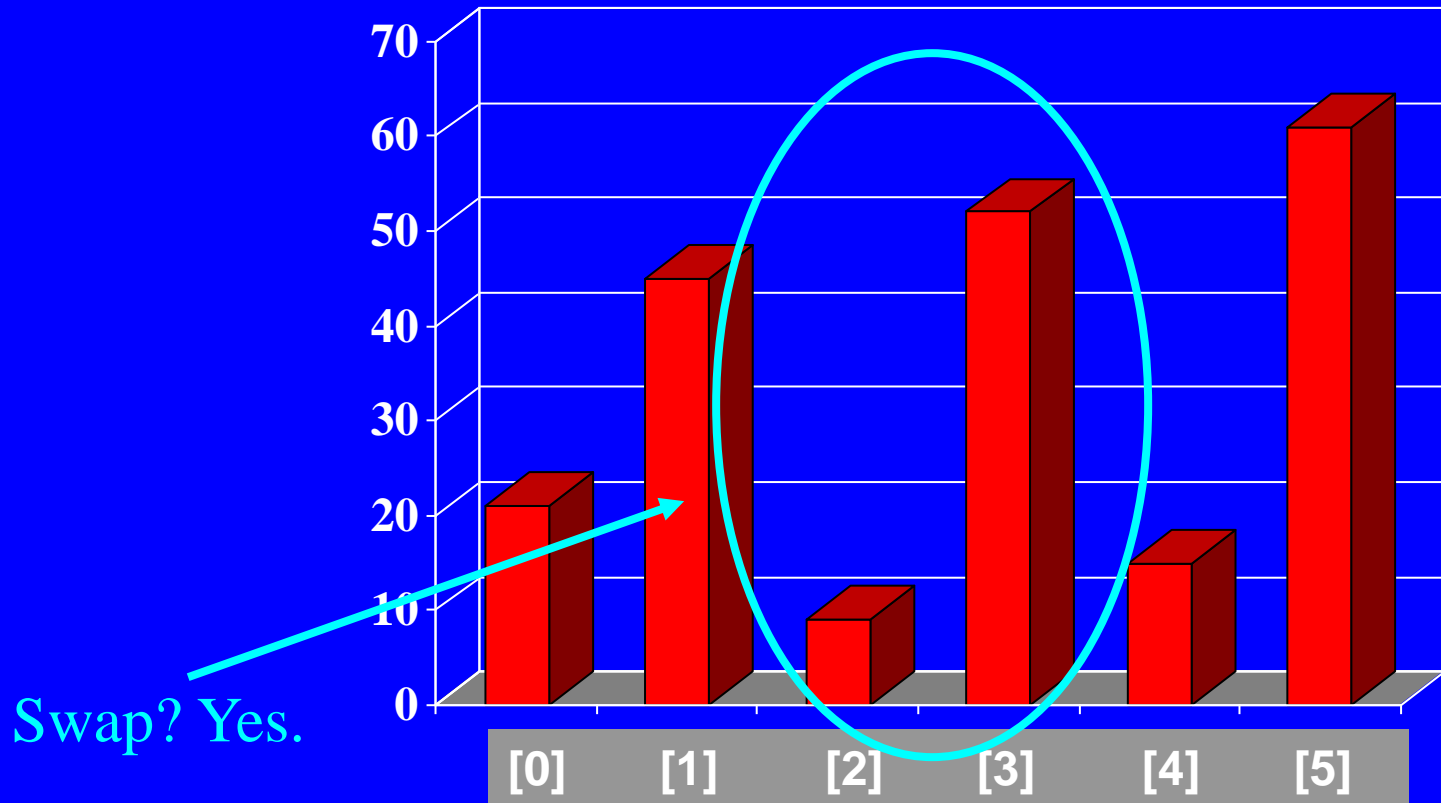
The Bubble Sort Algorithm

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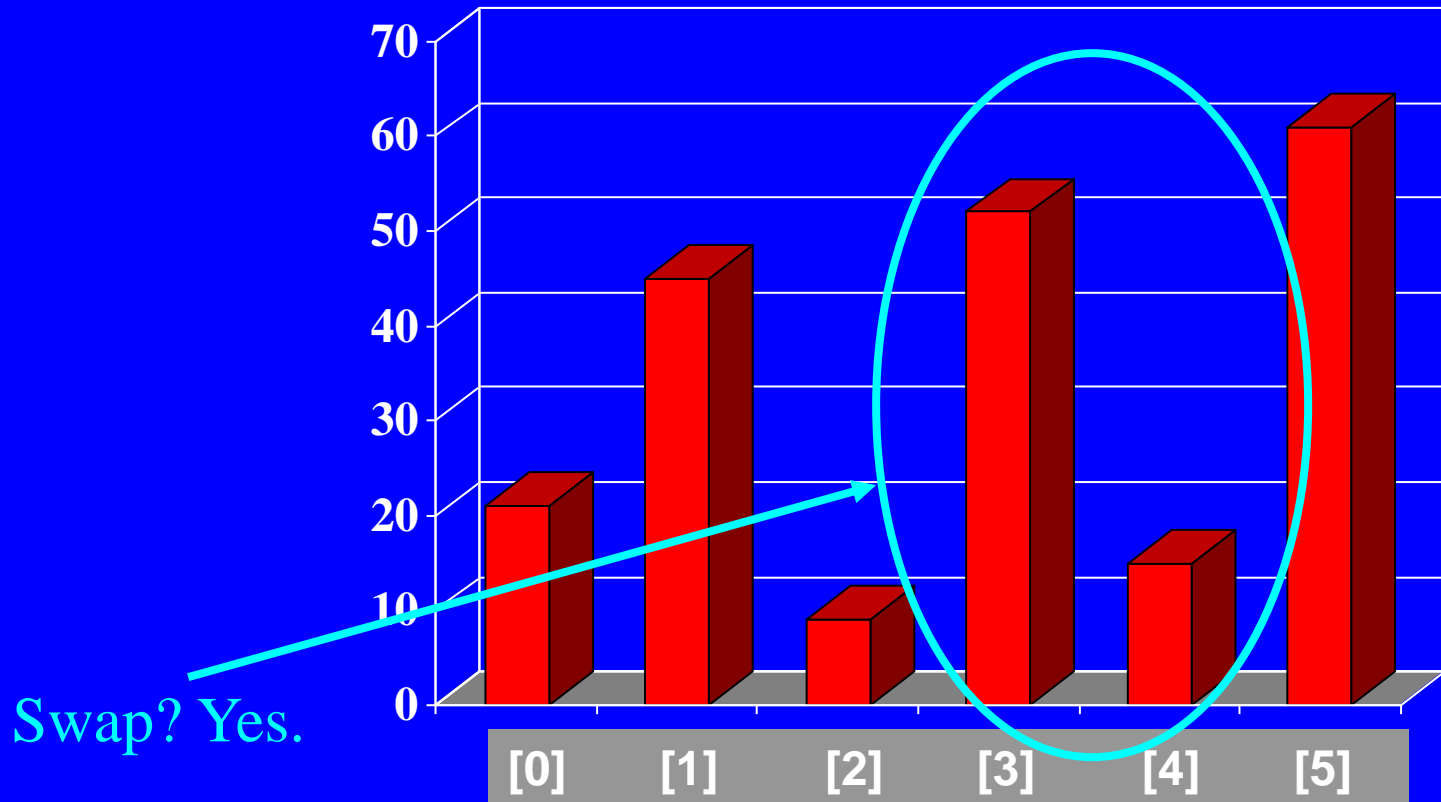
The Bubble Sort Algorithm

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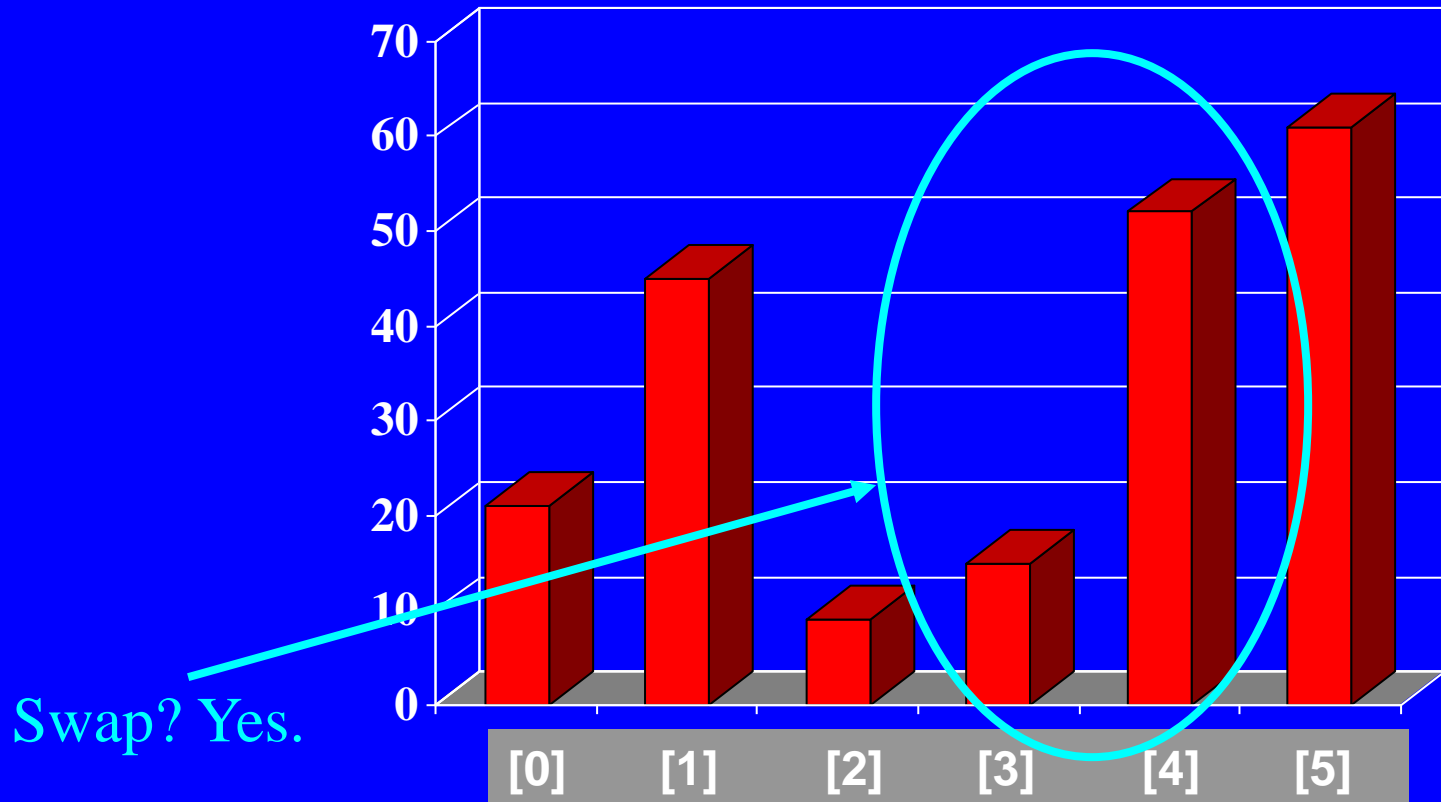
The Bubble Sort Algorithm

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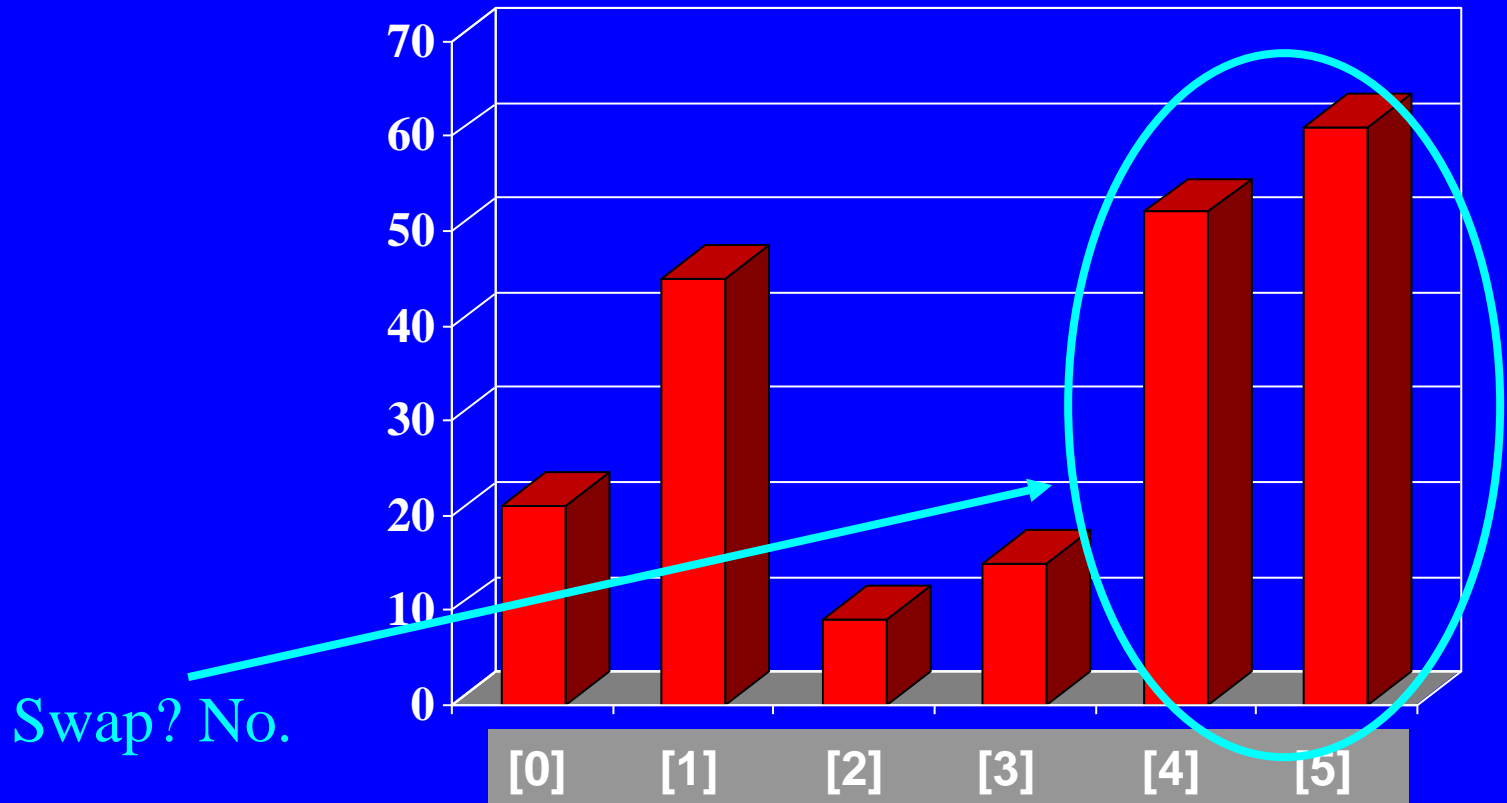
The Bubble Sort Algorithm

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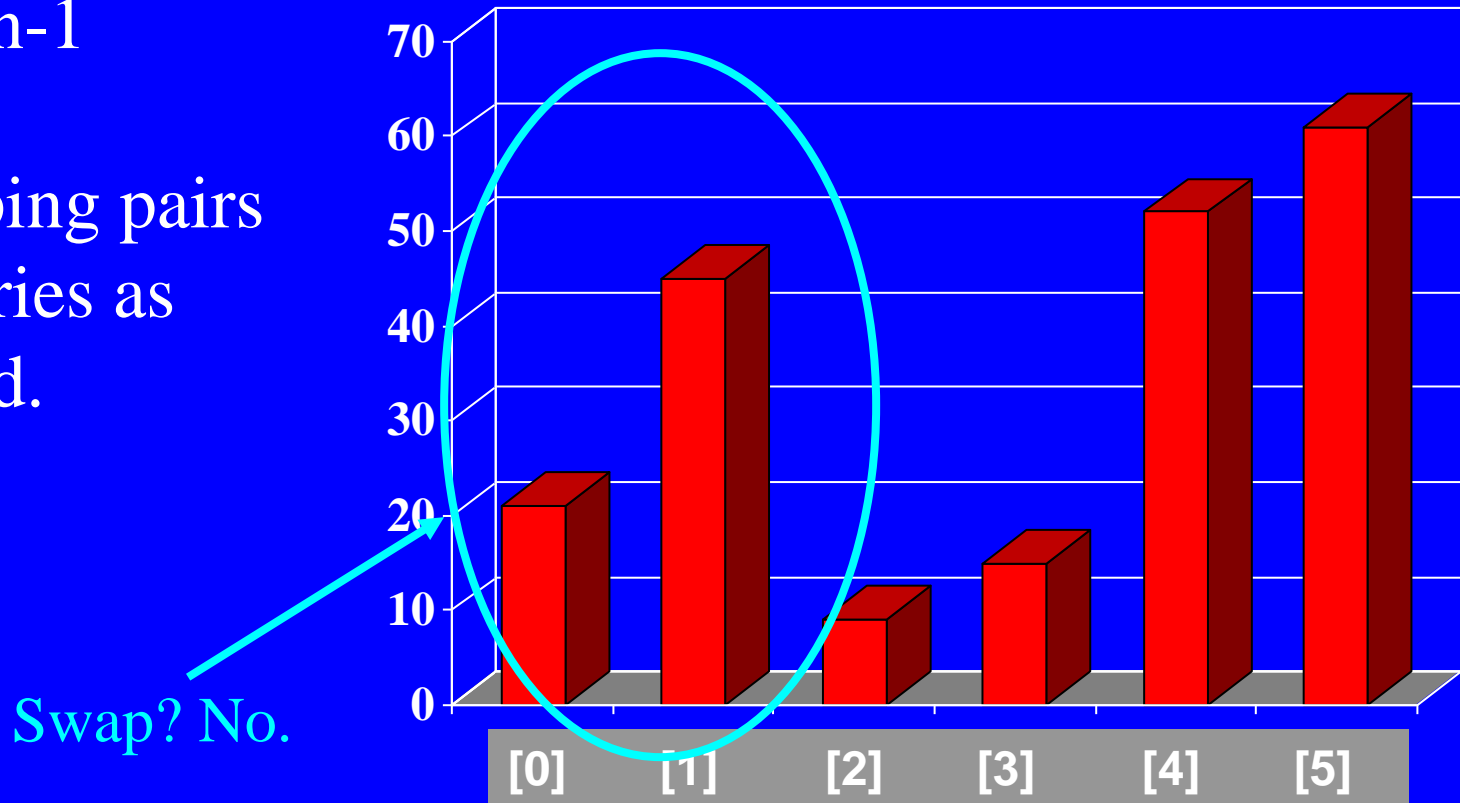
The Bubble Sort Algorithm

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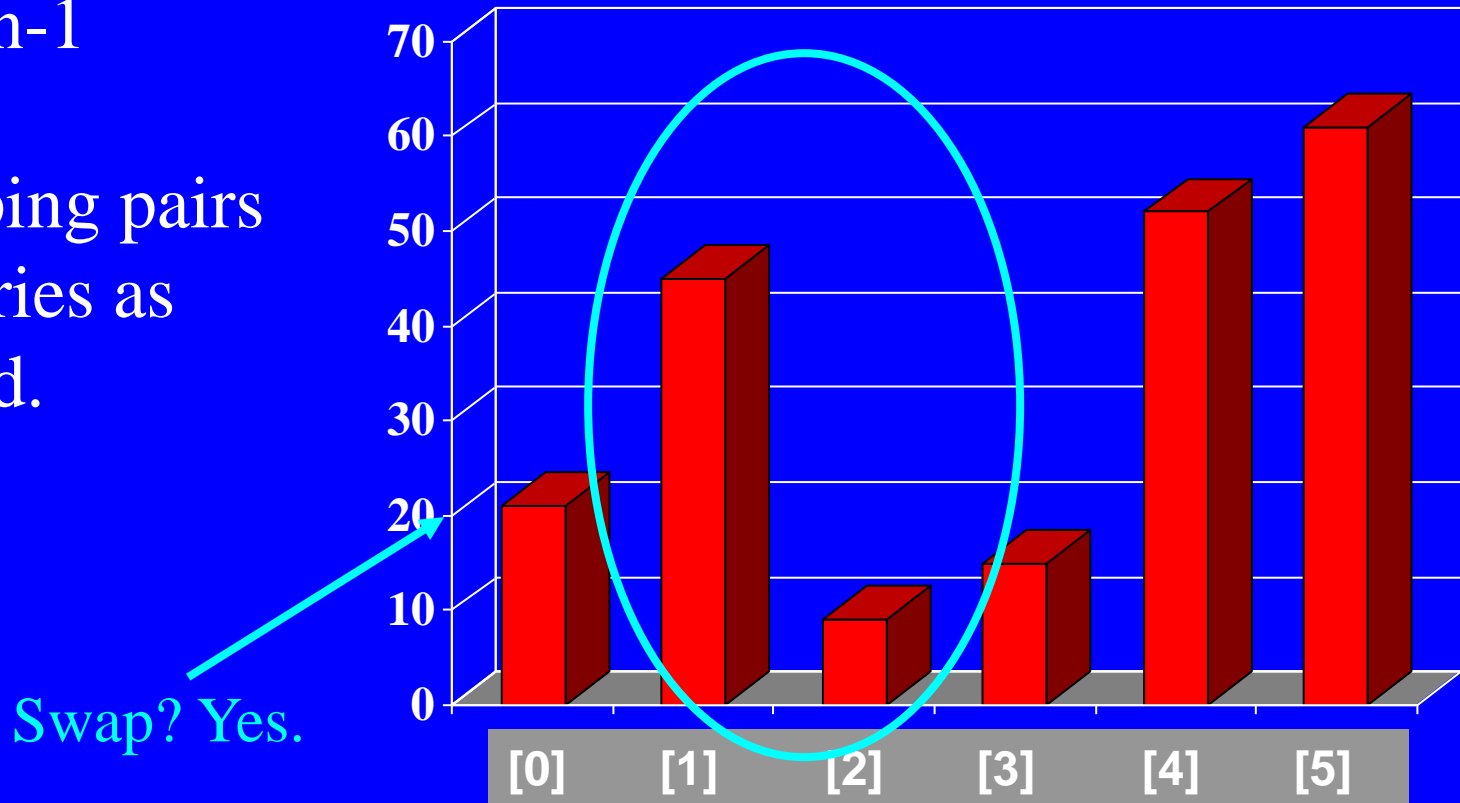
The Bubble Sort Algorithm

- Loop over array $n-1$ times, swapping pairs of entries as needed.



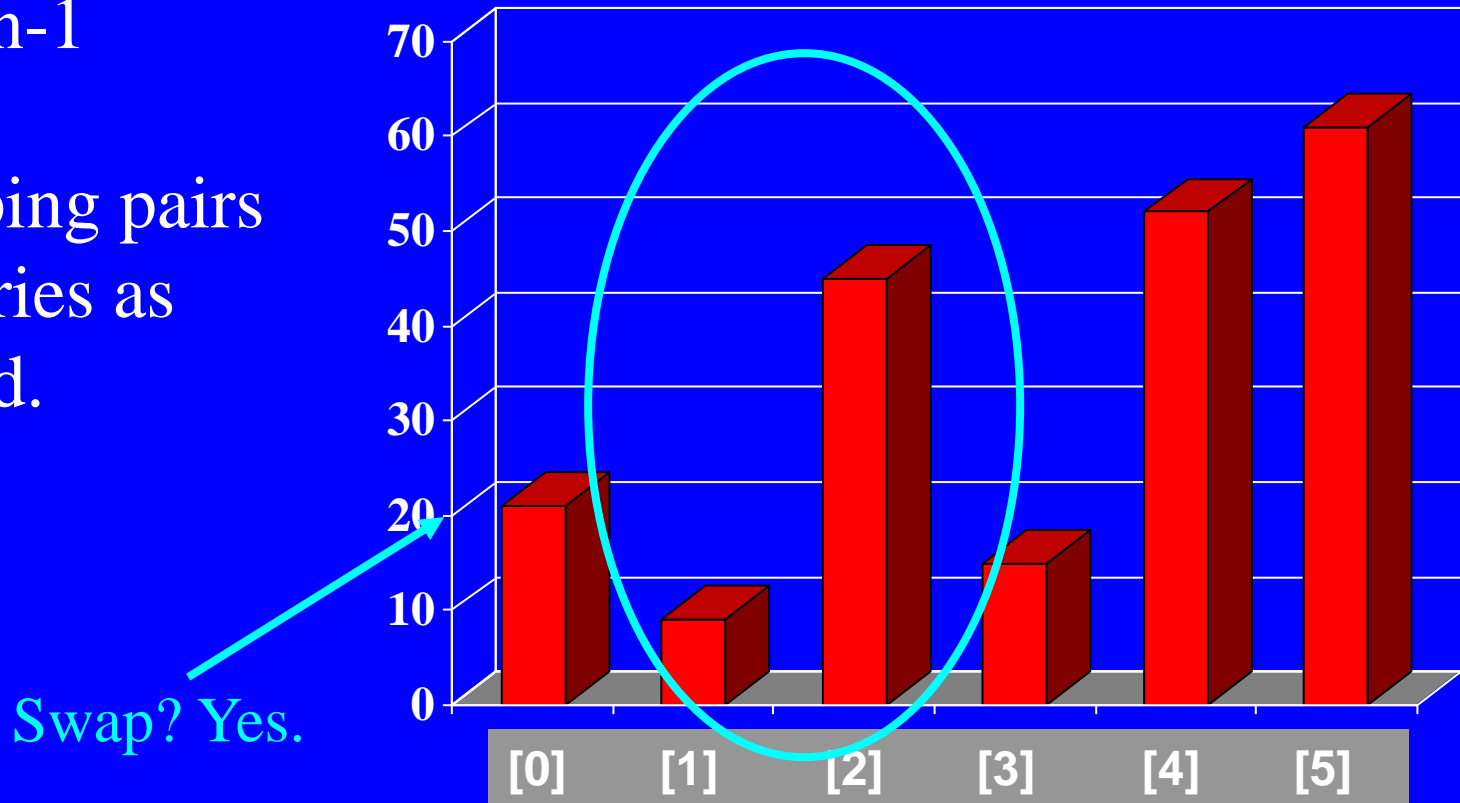
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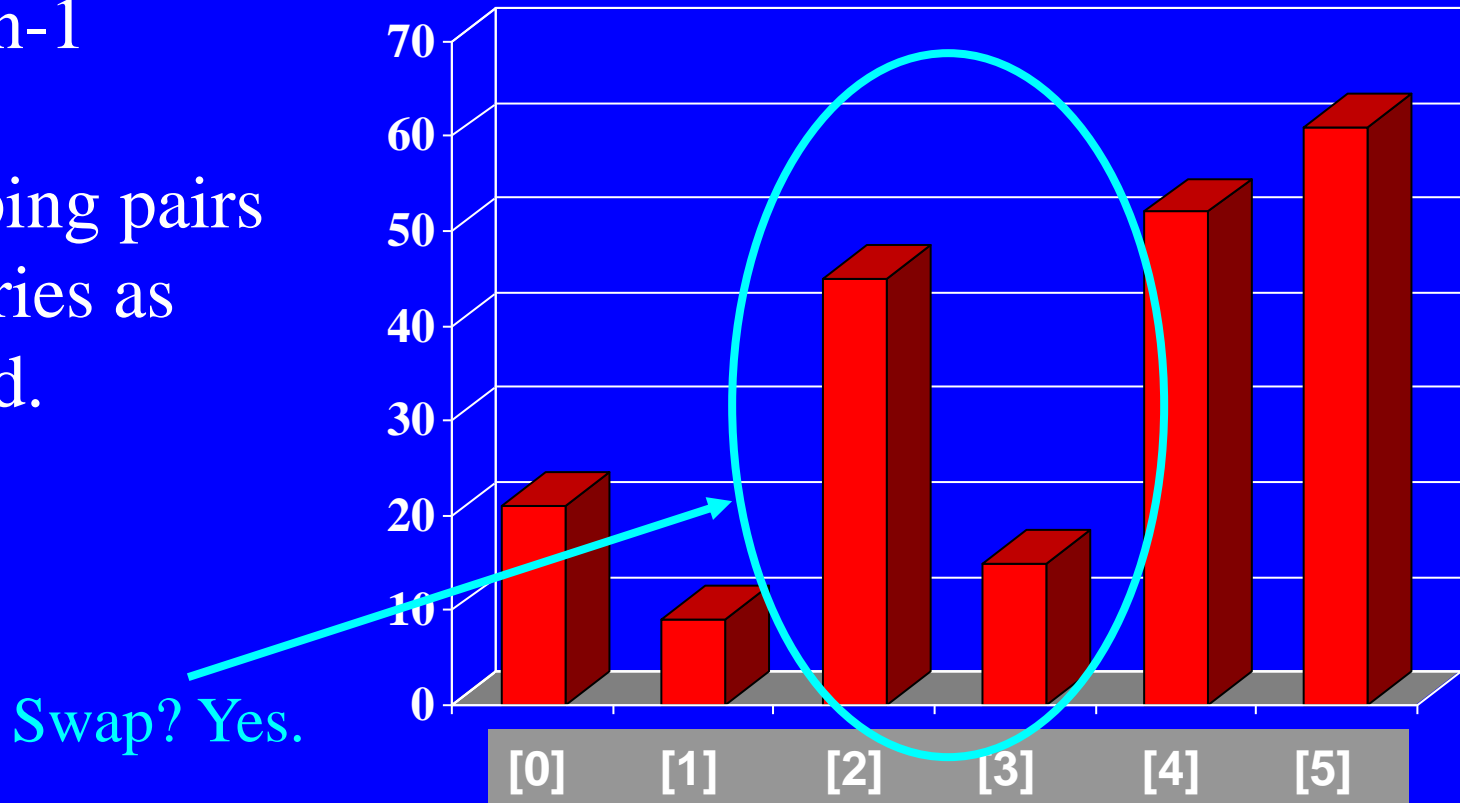
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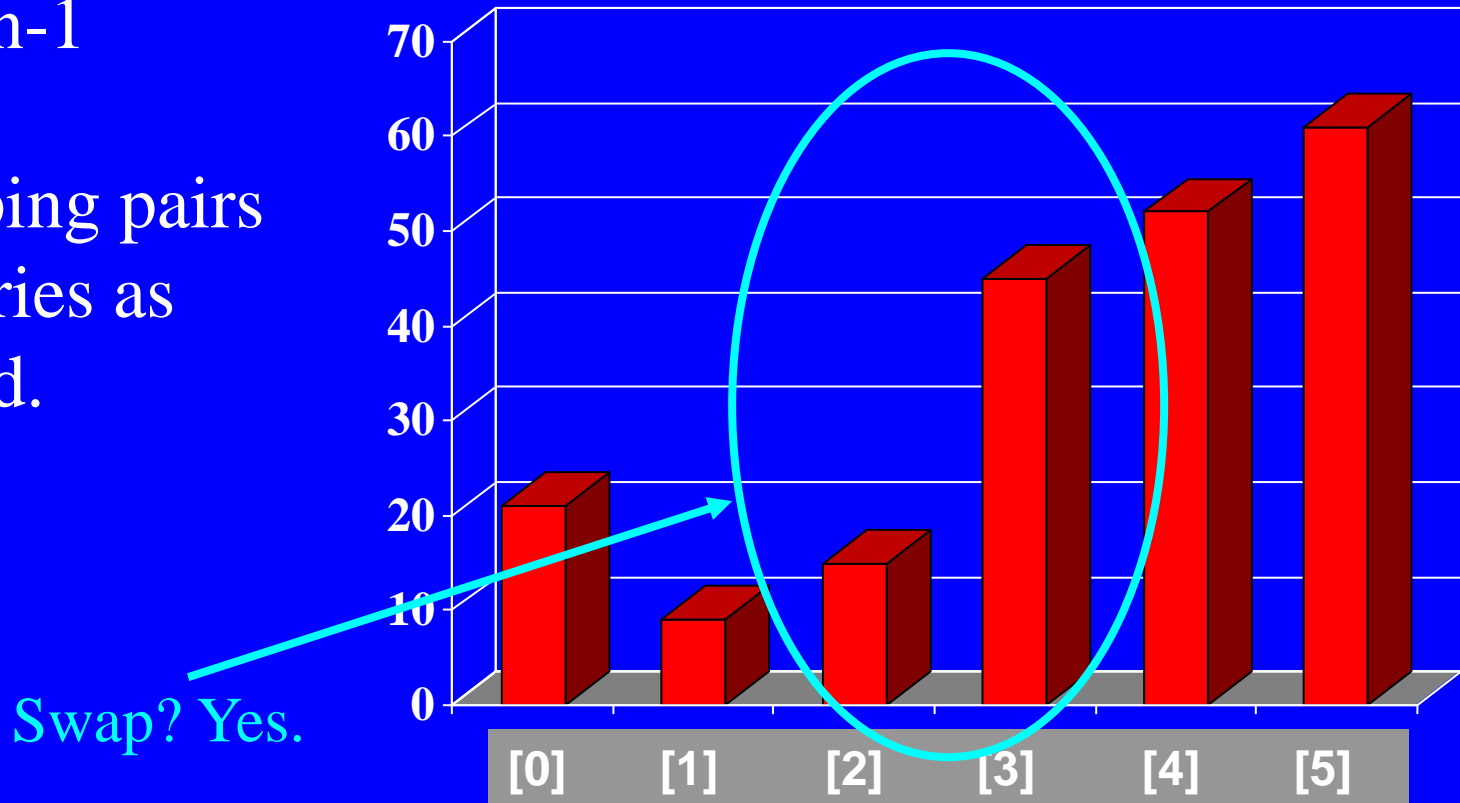
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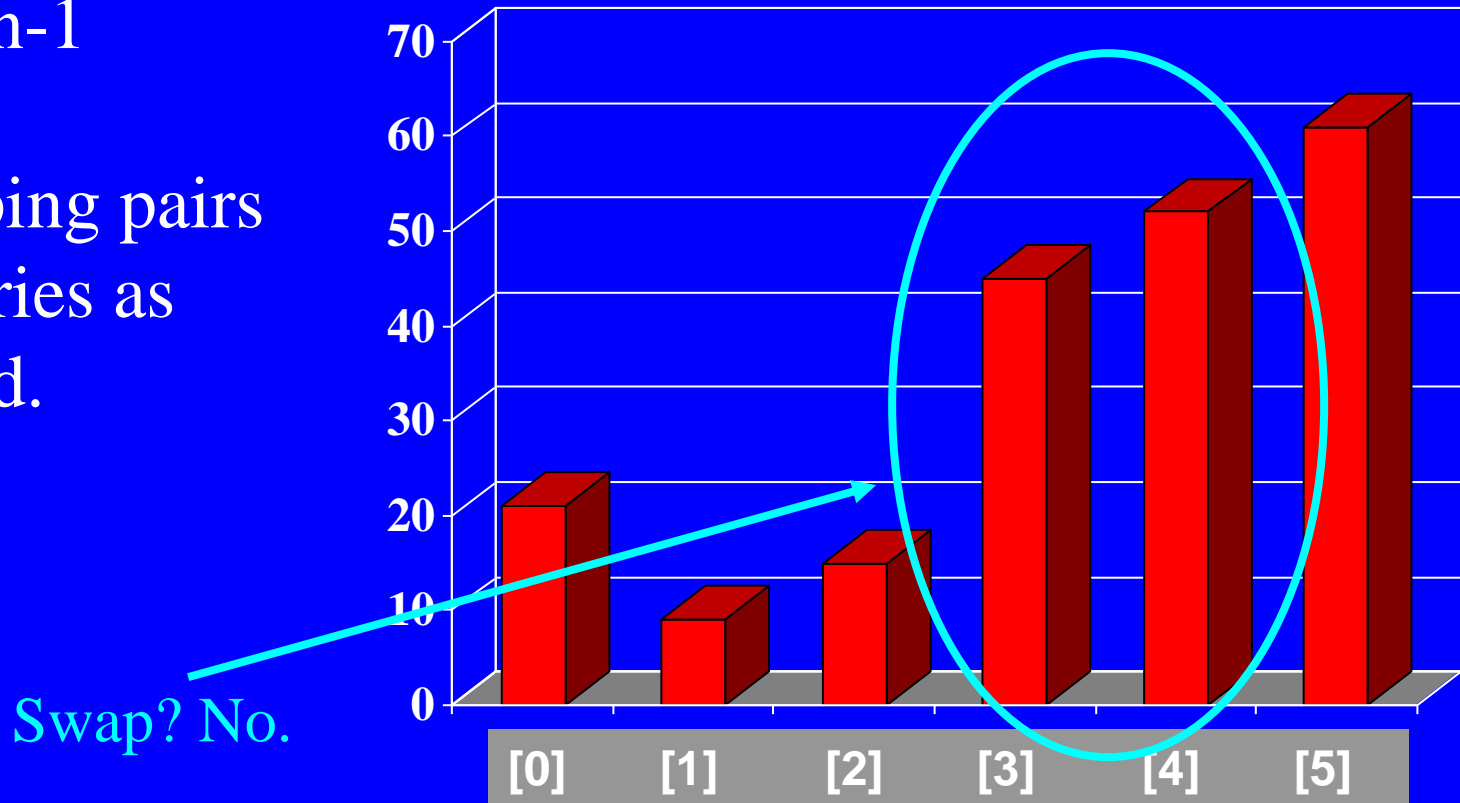
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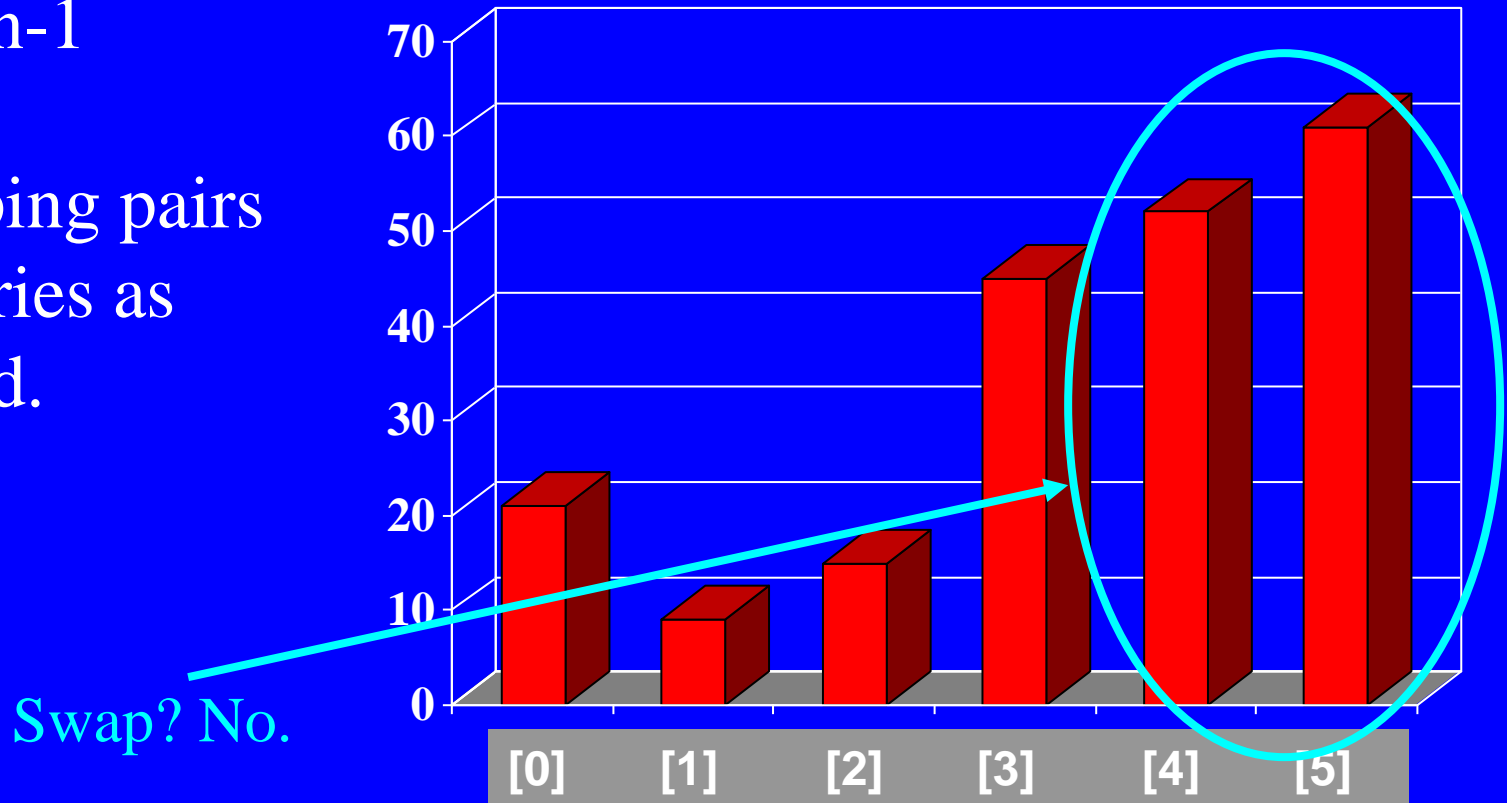
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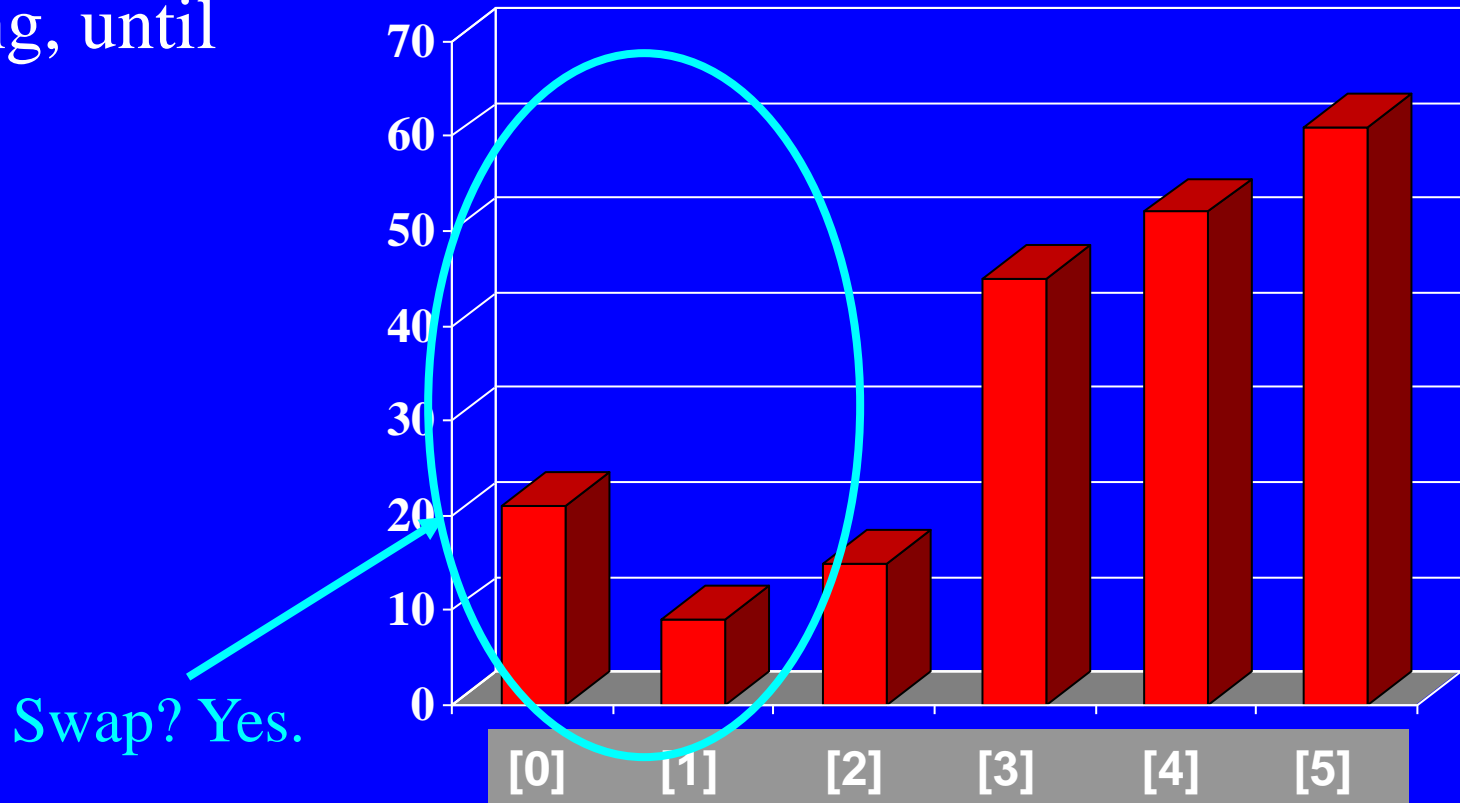
The Bubble Sort Algorithm

- Loop over array $n-1$ times, swapping pairs of entries as needed.



The Bubble Sort Algorithm

- Continue looping, until done.



```
public static void bubblesort(int a[],int n)
{
    for(int i=0;i<n-1;i++)
    {
        for(int j=0;j<n-1;j++)
        {
            if(a[j]>a[j+1])
            {
                int t=a[j];
                a[j]=a[j+1];
                a[j+1]=t;
            }
        }
    }
}
```

```
template <class Item>
void bubble_sort(Item data[ ], size_t n)
{
    size_t i, j;
    Item temp;

    if(n < 2) return; // nothing to sort!!

    for(i = 0; i < n-1; ++i)
    {
        for(j = 0; j < n-1; ++j)
            if(data[j] > data[j+1])    // if out of order, swap!
            {
                temp = data[j];
                data[j] = data[j+1];
                data[j+1] = temp;
            }
    }
}
```

Timing and Other Issues

- Selection Sort, Insertion Sort, and Bubble Sort all have a worst-case time of $O(n^2)$, making them impractical for large arrays.
- But they are easy to program, easy to debug.
- Insertion Sort also has good performance when the array is nearly sorted to begin with.
- But more sophisticated sorting algorithms are needed when good performance is needed in all cases for large arrays.
- Next time: Merge Sort, Quick Sort.

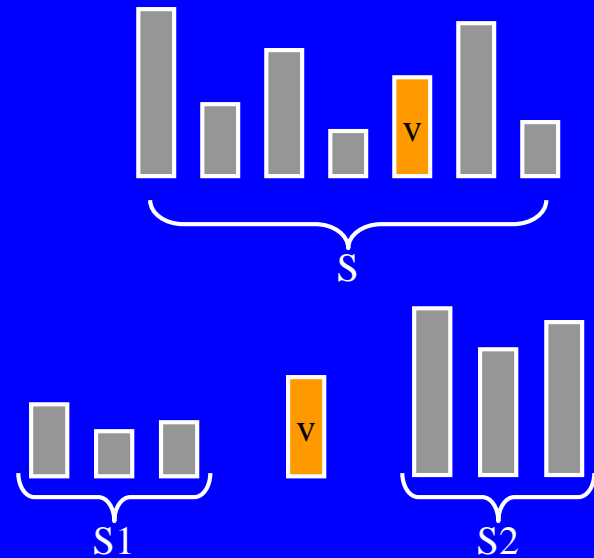
Quicksort

Introduction

- **Fastest** known sorting algorithm in practice
- Average case: $O(N \log N)$
- Worst case: $O(N^2)$
 - But, the worst case seldom happens.
- Another divide-and-conquer recursive algorithm, like mergesort

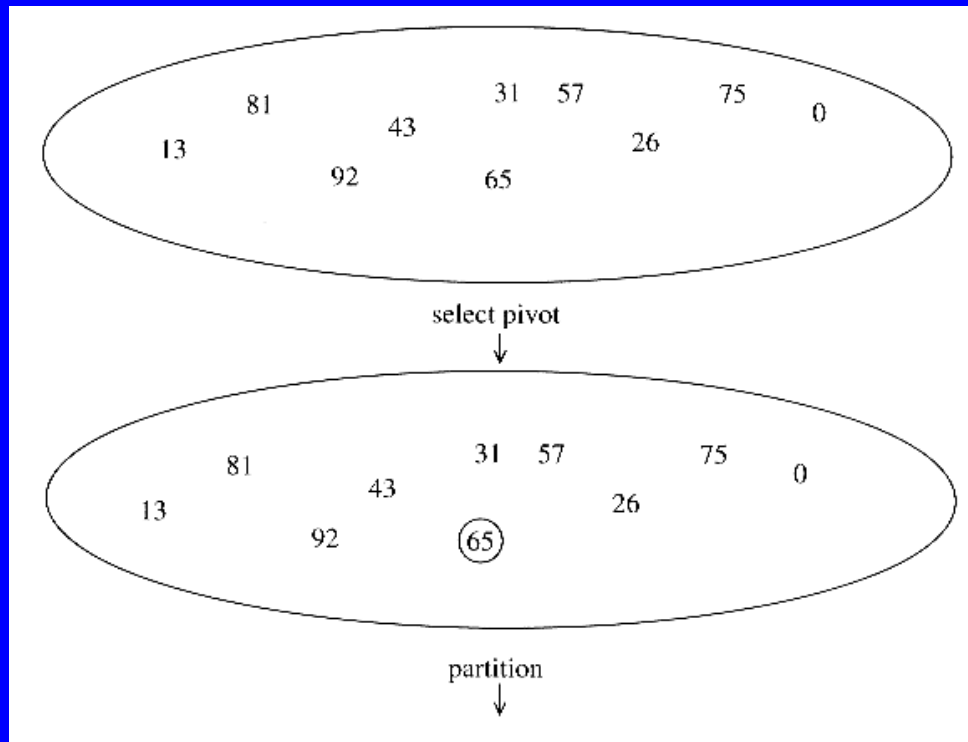
Quicksort

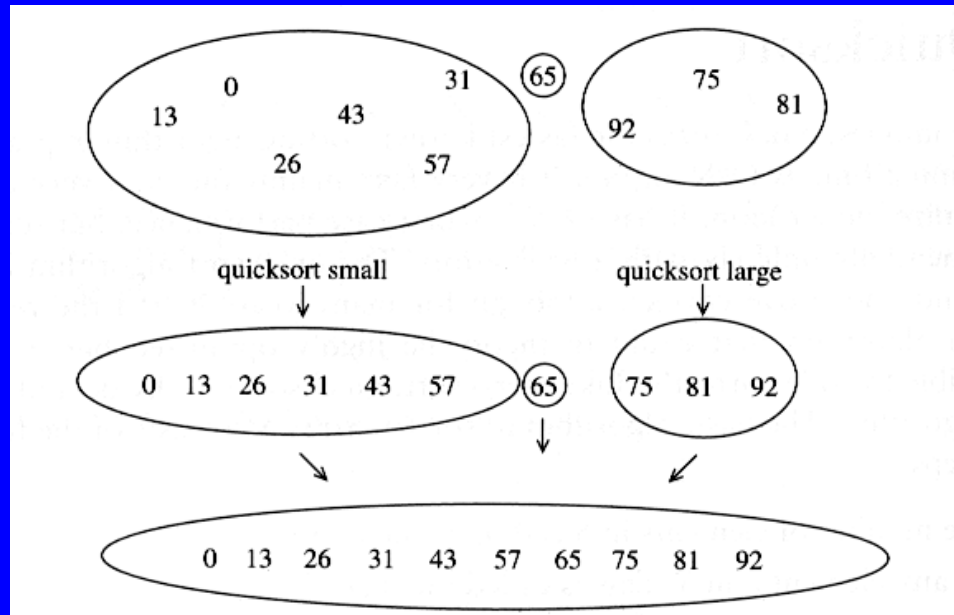
- Divide step:
 - Pick any element (*pivot*) v in S
 - Partition $S - \{v\}$ into two disjoint groups
$$S1 = \{x \in S - \{v\} \mid x \leq v\}$$
$$S2 = \{x \in S - \{v\} \mid x \geq v\}$$
- Conquer step: recursively sort $S1$ and $S2$
- Combine step: the sorted $S1$ (by the time returned from recursion), followed by v , followed by the sorted $S2$ (i.e., nothing extra needs to be done)



To simplify, we may assume that we don't have repetitive elements,
So to ignore the 'equality' case!

Example





Pseudo-code

Input: an array `a[left, right]`

```
QuickSort (a, left, right) {  
    if (left < right) {  
        pivot = Partition (a, left, right)  
        Quicksort (a, left, pivot-1)  
        Quicksort (a, pivot+1, right)  
    }  
}
```

Compare with MergeSort:

```
MergeSort (a, left, right) {  
    if (left < right) {  
        mid = divide (a, left, right)  
        MergeSort (a, left, mid-1)  
        MergeSort (a, mid+1, right)  
        merge(a, left, mid+1, right)  
    }  
}
```

Quicksort Algorithm

Given an array of n elements (e.g., integers):

- If array only contains one element, return
- Else
 - pick one element to use as *pivot*.
 - Partition elements into two sub-arrays:
 - Elements less than or equal to pivot
 - Elements greater than pivot
 - Quicksort two sub-arrays
 - Return results

Example

We are given array of n integers to sort:

40	20	10	80	60	50	7	30	100
----	----	----	----	----	----	---	----	-----

Pick Pivot Element

There are a number of ways to pick the pivot element. In this example, we will use the first element in the array:

40	20	10	80	60	50	7	30	100
----	----	----	----	----	----	---	----	-----

Partitioning Array

Given a pivot, partition the elements of the array such that the resulting array consists of:

1. One sub-array that contains elements \geq pivot
2. Another sub-array that contains elements $<$ pivot

The sub-arrays are stored in the original data array.

Partitioning loops through, swapping elements below/above pivot.

pivot_index = 0

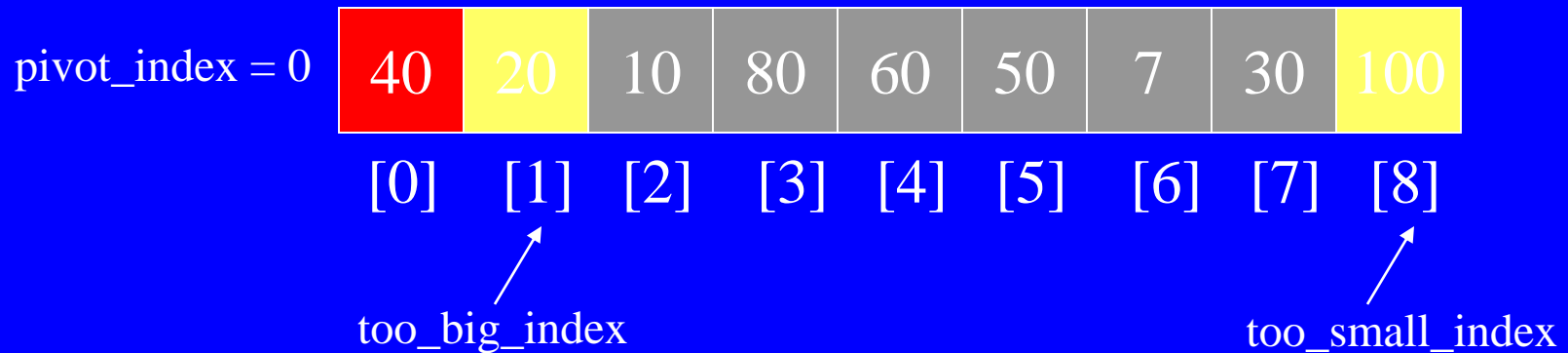
40	20	10	80	60	50	7	30	100
----	----	----	----	----	----	---	----	-----

[0] [1] [2] [3] [4] [5] [6] [7] [8]

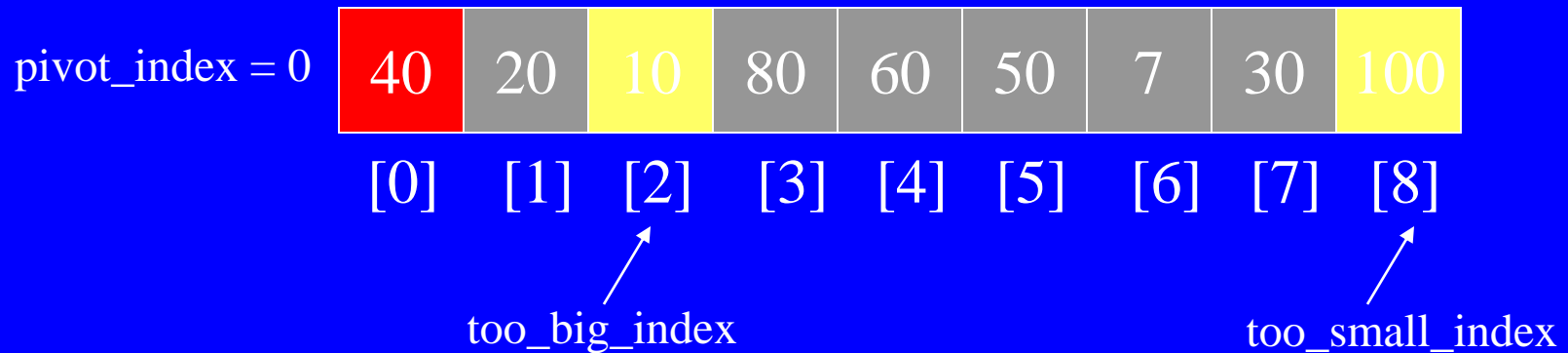
too_big_index
↖

too_small_index
↖

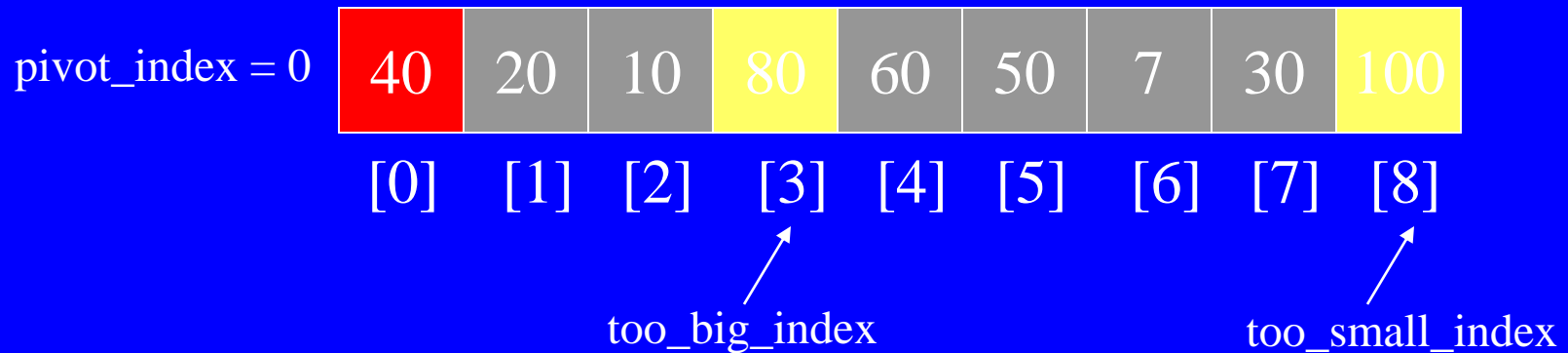
1. While `data[too_big_index] <= data[pivot]`
 `++too_big_index`



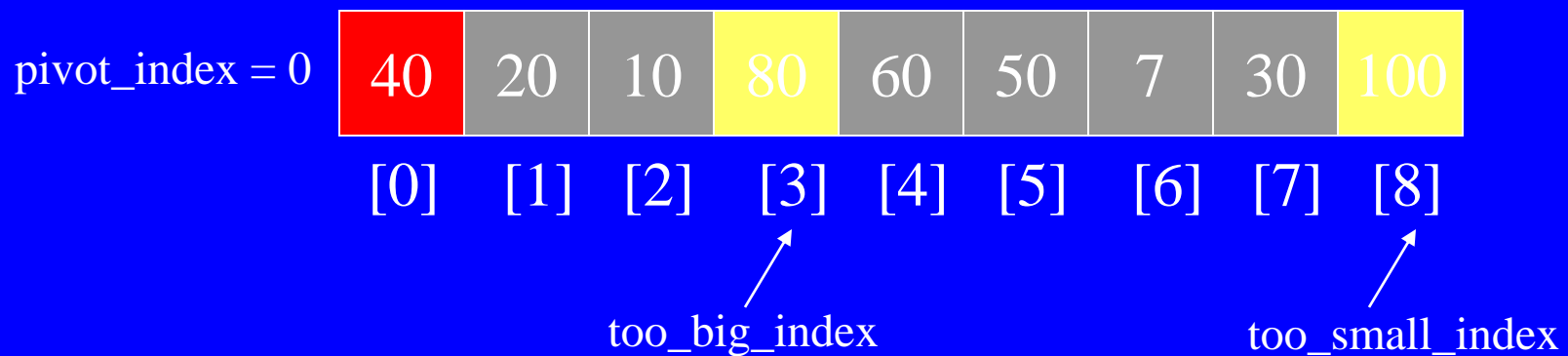
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 `++too_big_index`



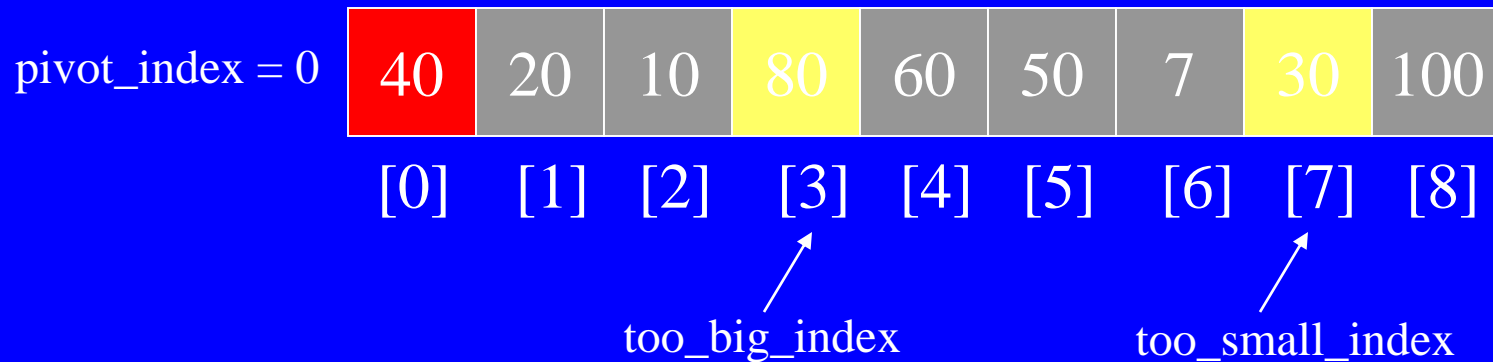
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 `++too_big_index`



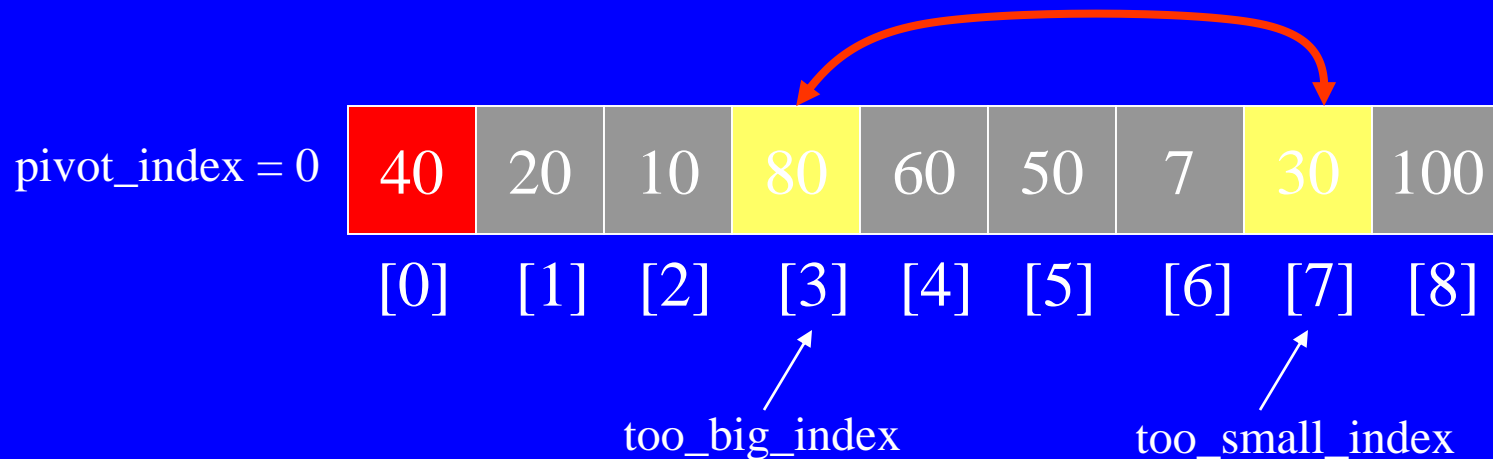
1. While `data[too_big_index] <= data[pivot]`
 `++too_big_index`
2. While `data[too_small_index] > data[pivot]`
 `--too_small_index`



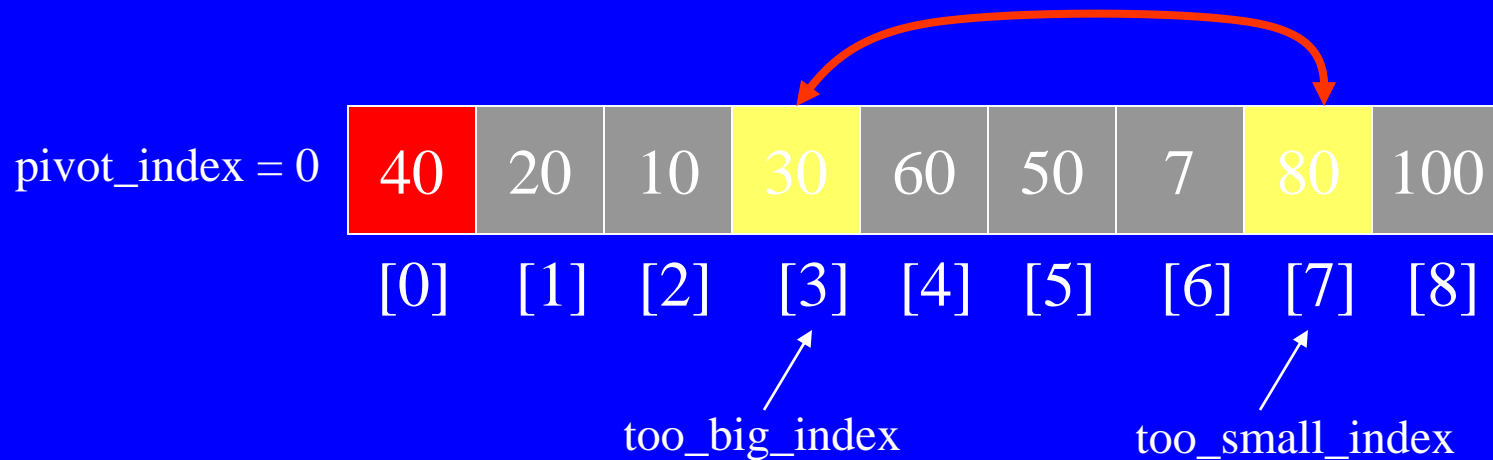
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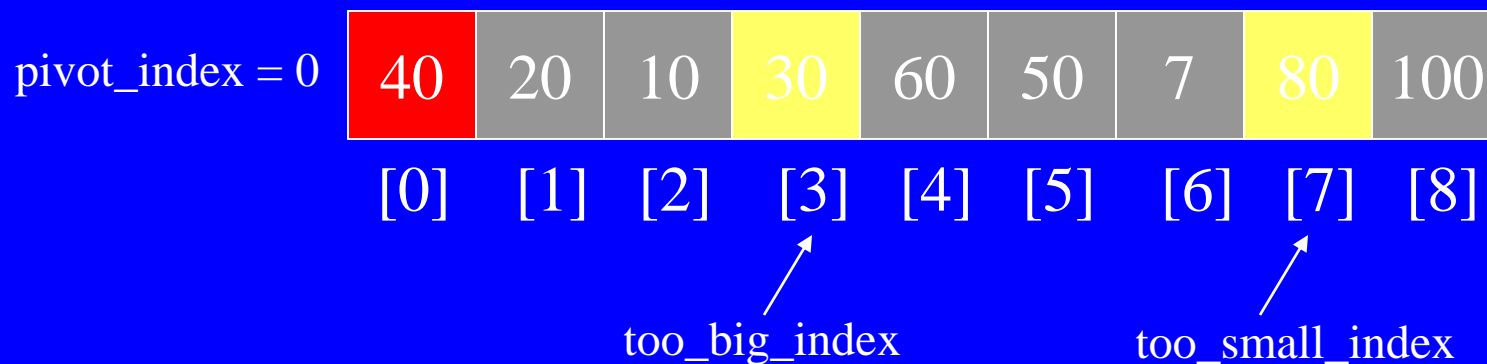
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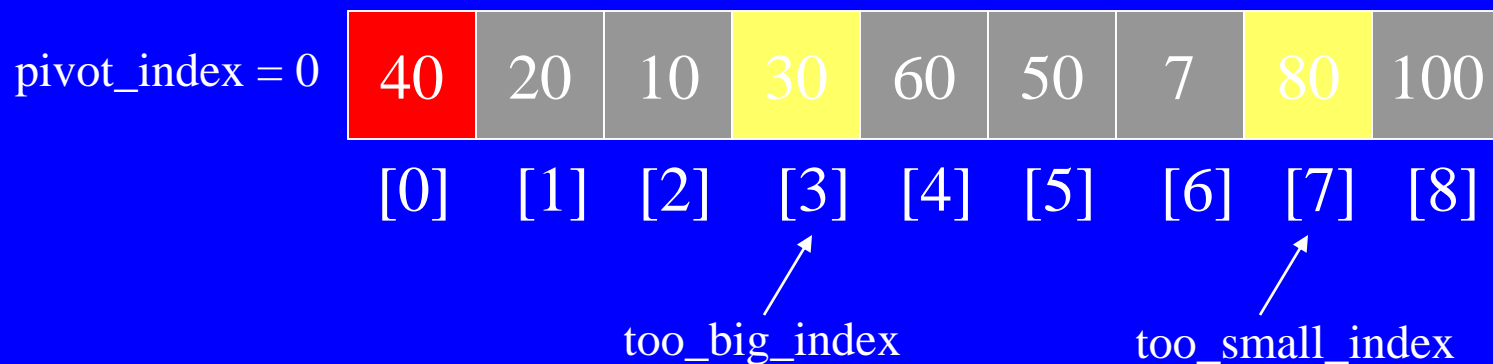
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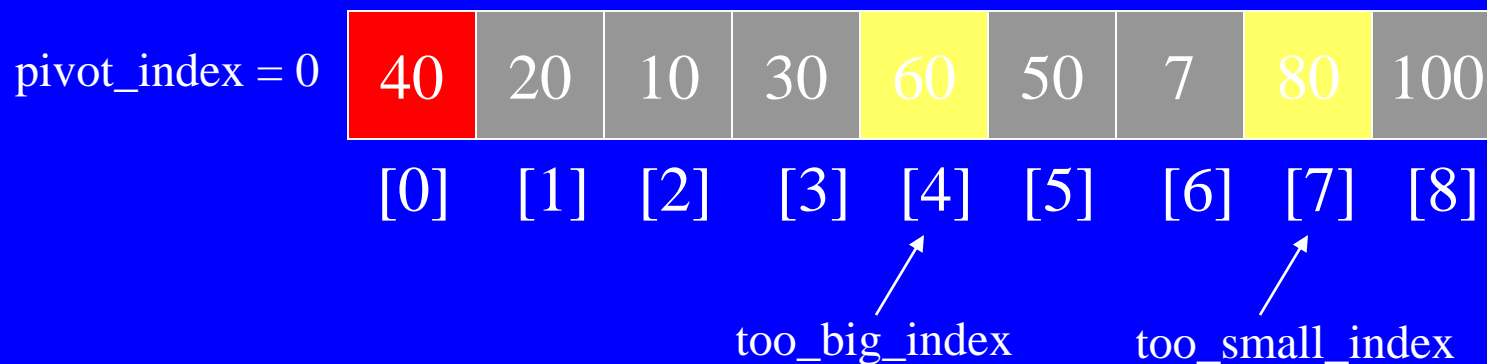
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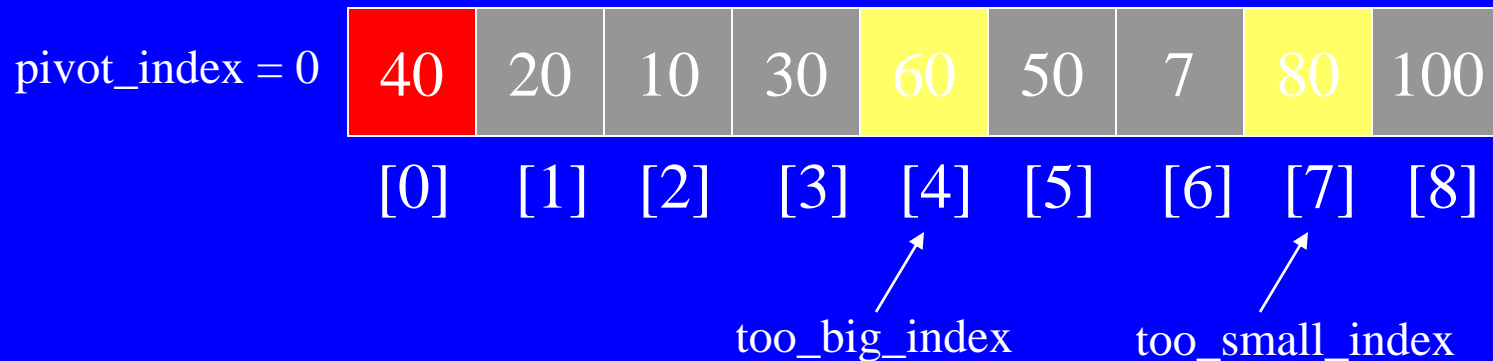
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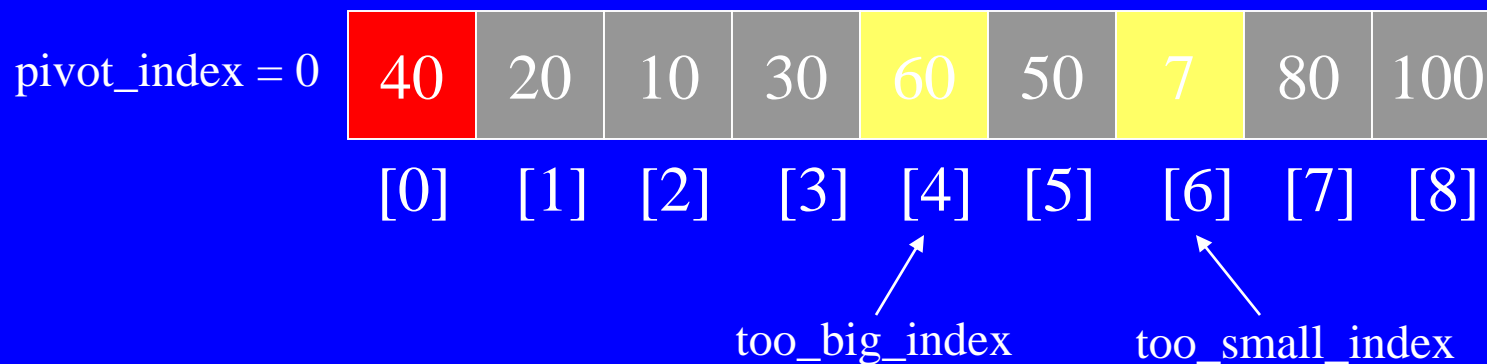
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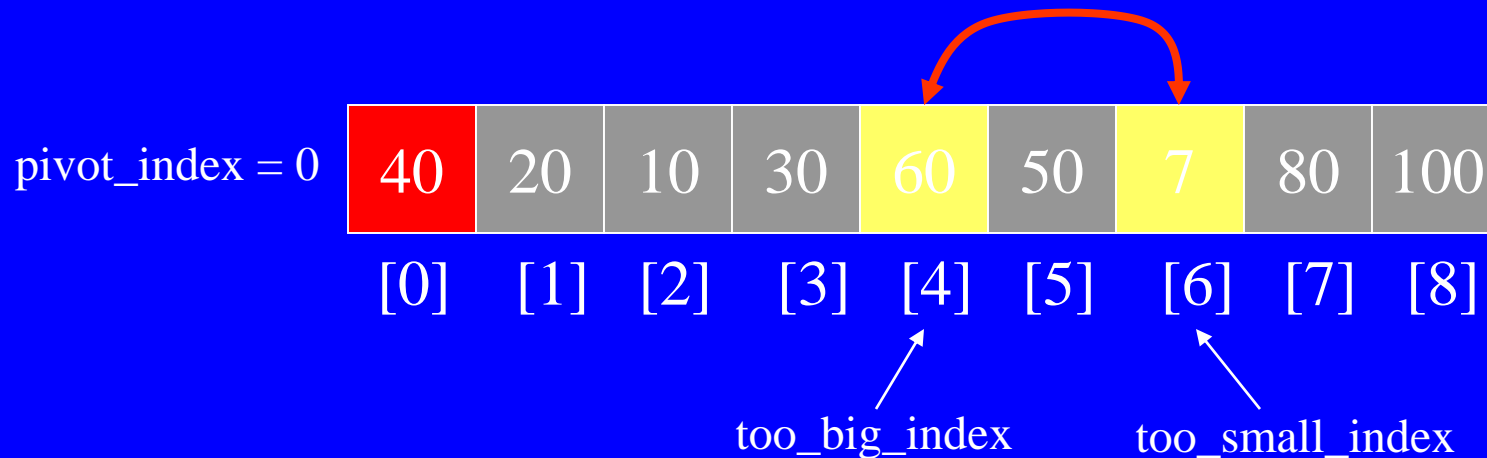
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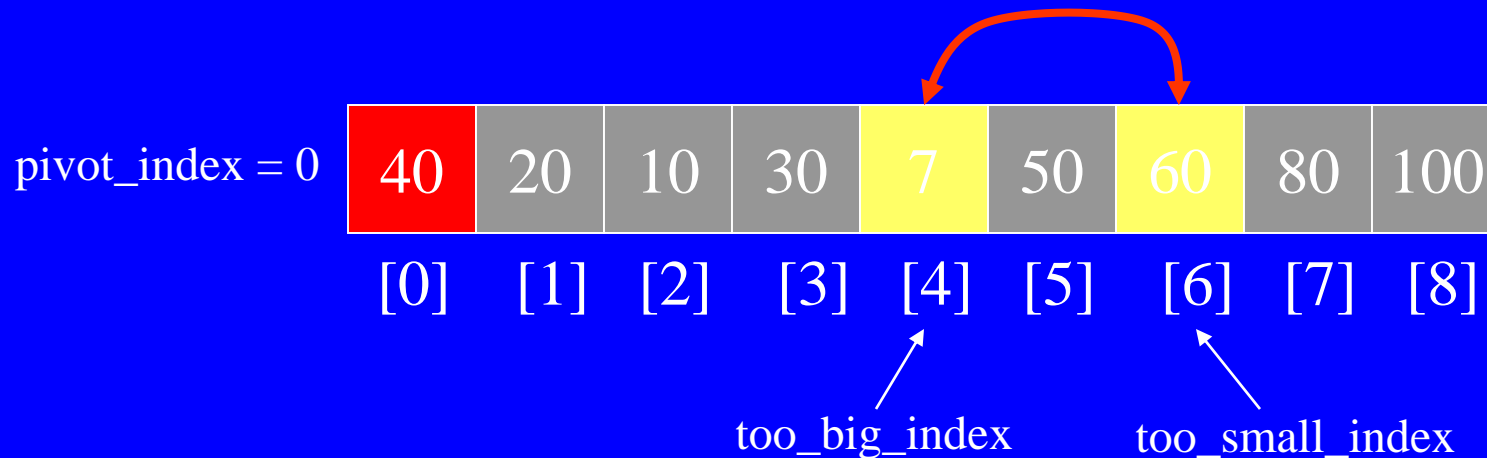
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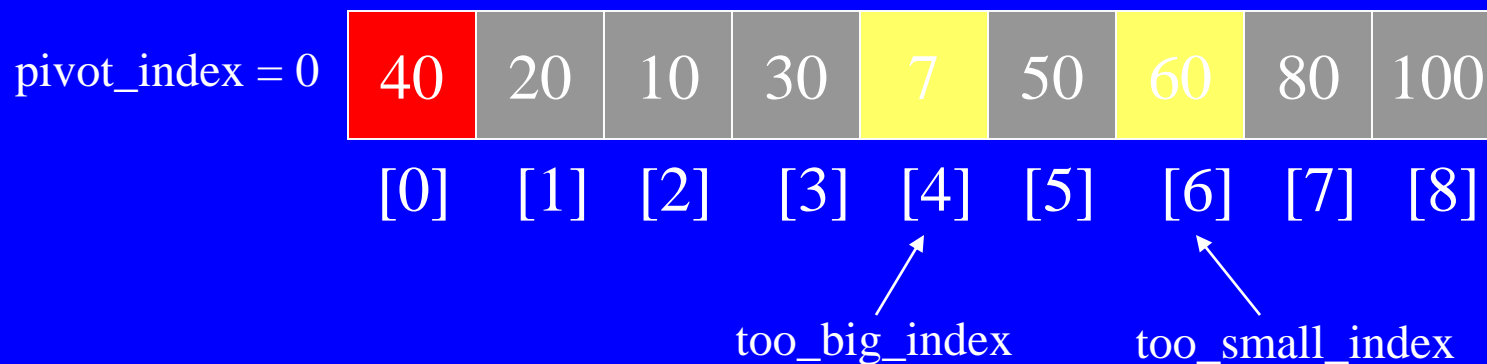
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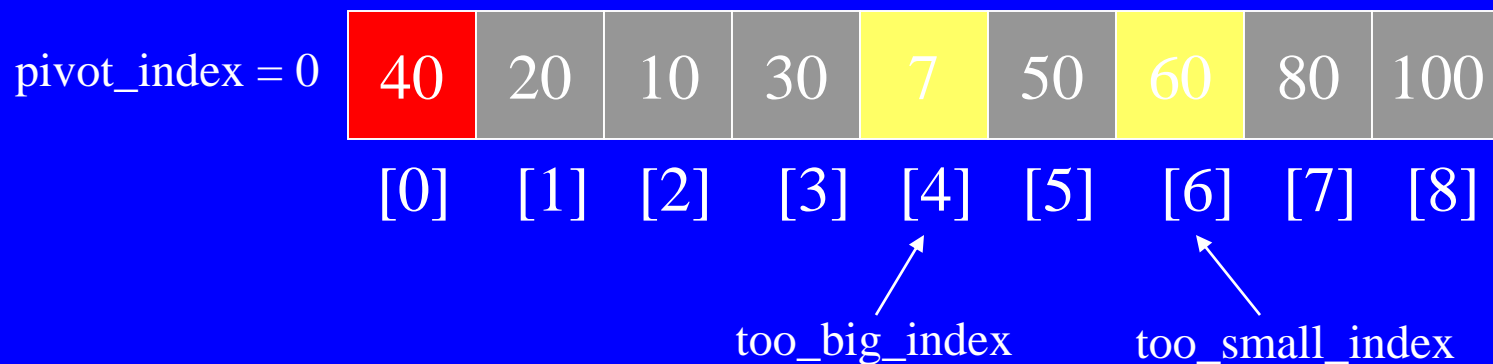
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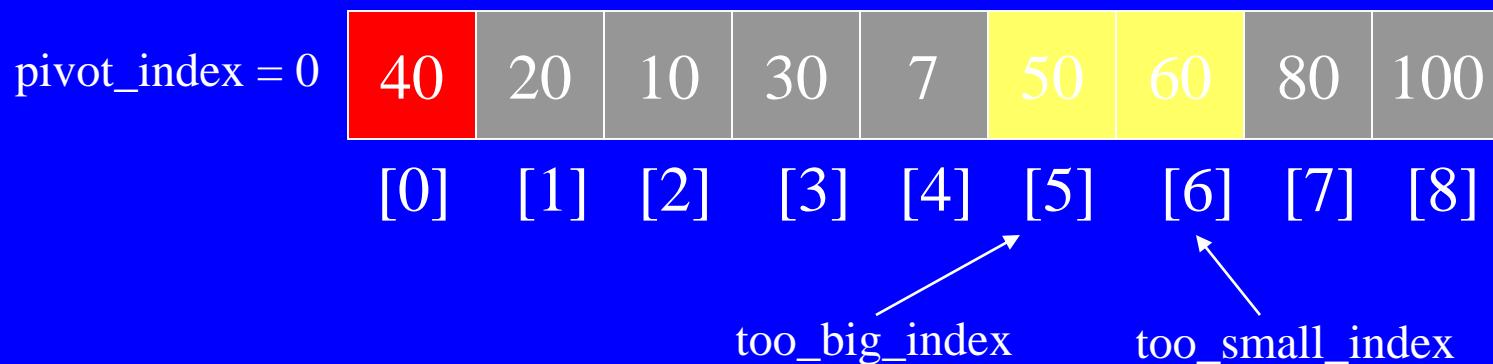
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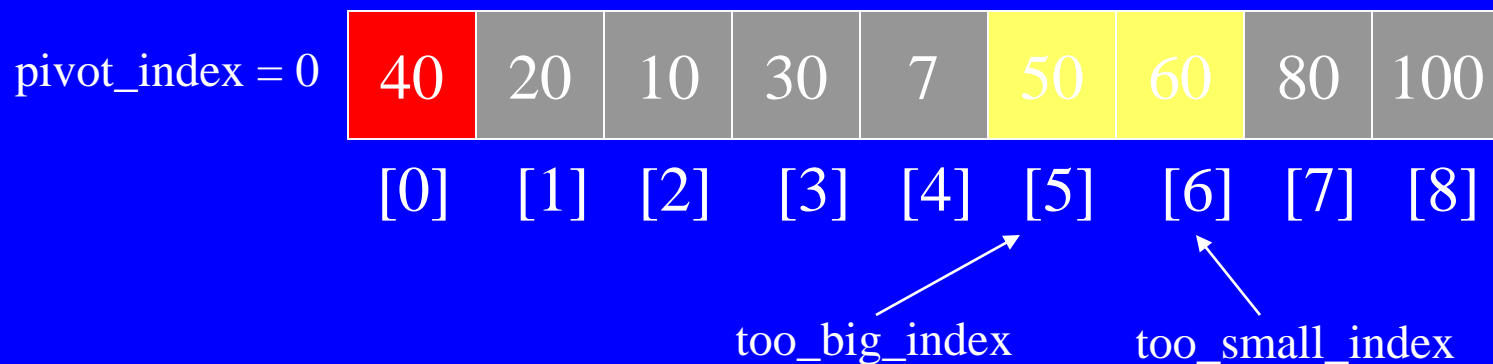
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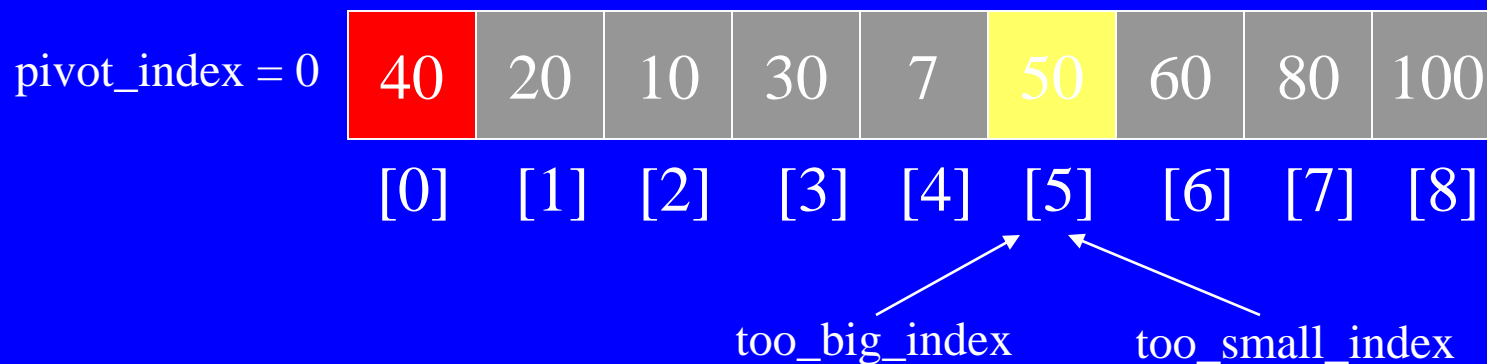
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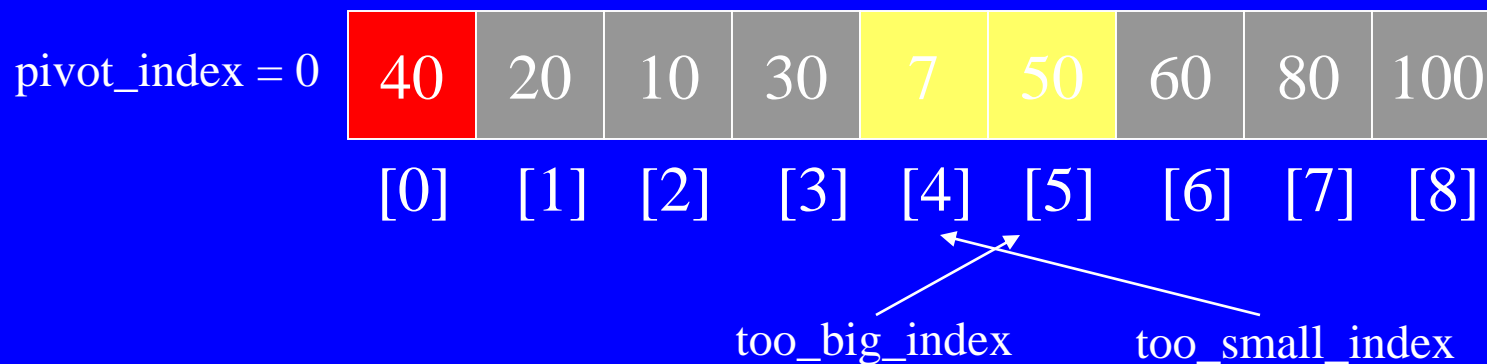
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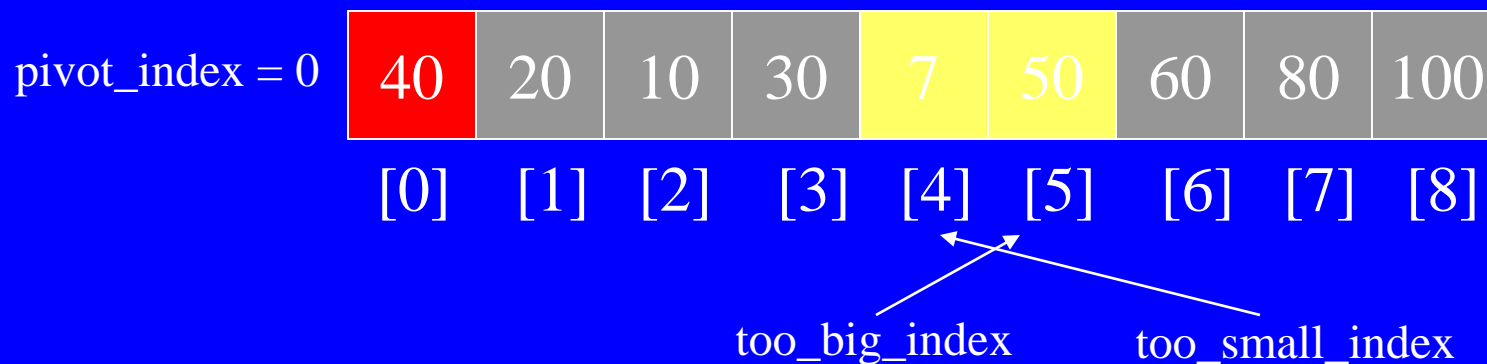
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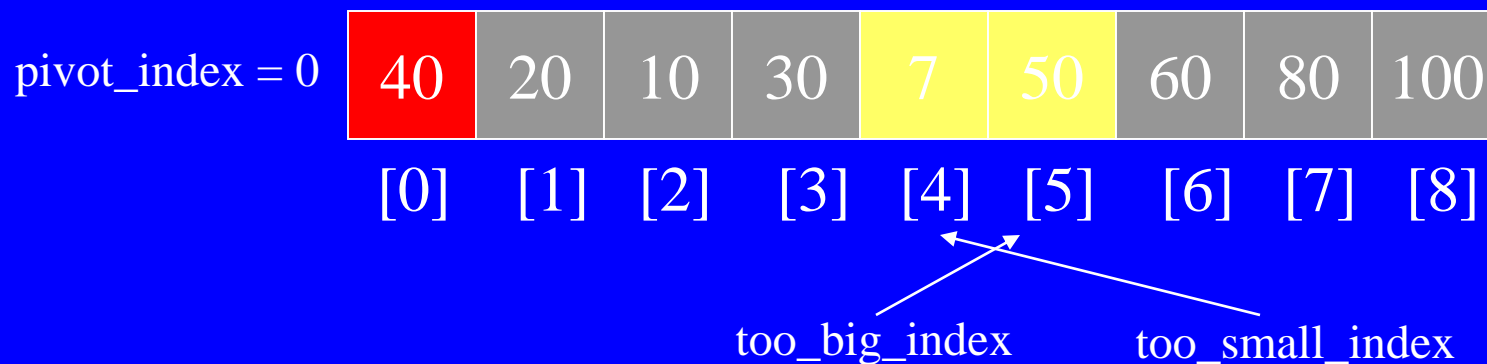
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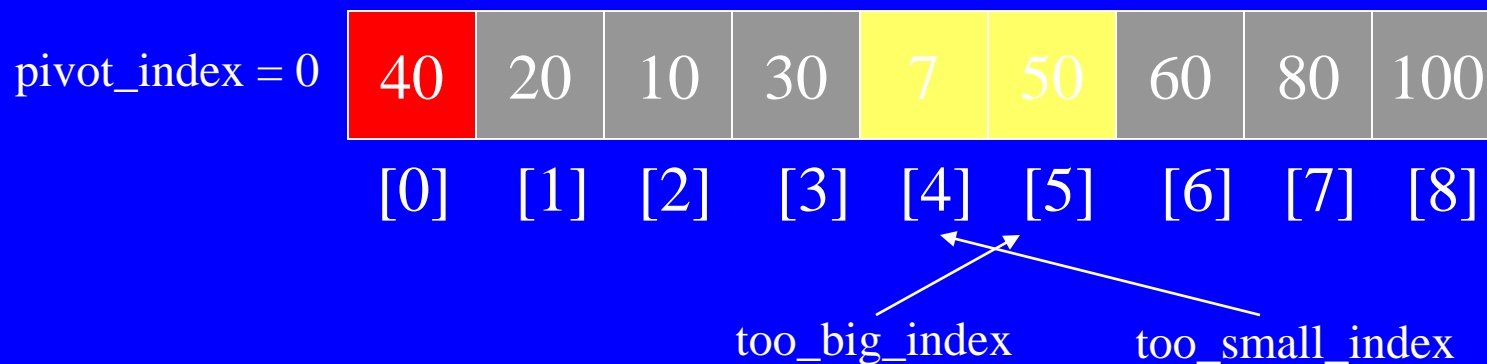
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pivot_index = 4

7	20	10	30	40	50	60	80	100
[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]

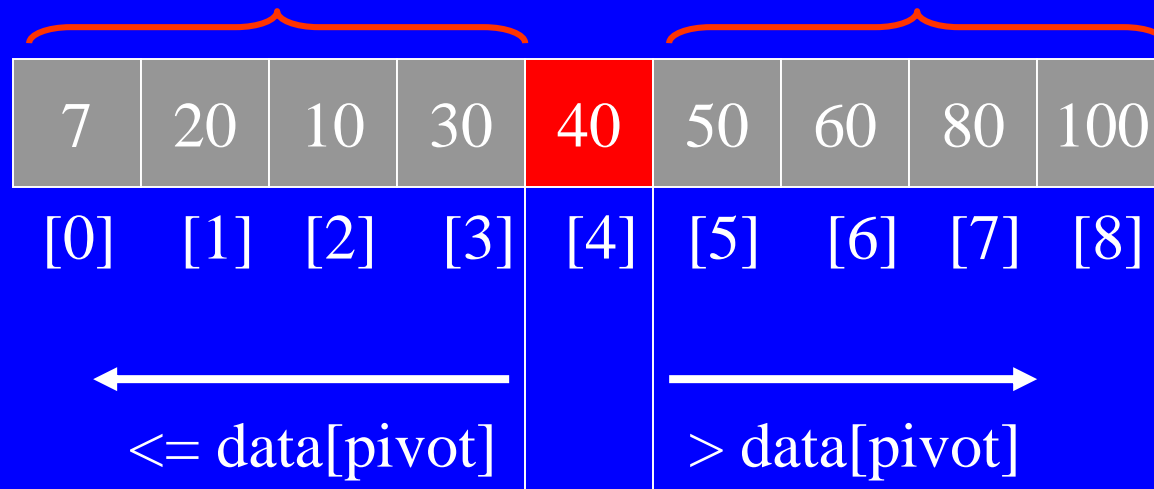
too_big_index

too_small_index

Partition Result

7	20	10	30	40	50	60	80	100
[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]
←					→			
≤ data[pivot]					> data[pivot]			

Recursion: Quicksort Sub-arrays



Quicksort Analysis

- Assume that keys are random, uniformly distributed.
- What is best case running time?

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 1. Partition splits array in two sub-arrays of size $n/2$
 2. Quicksort each sub-array

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- What is best case running time?
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 2. Quicksort each sub-array
 - Depth of recursion tree? $O(\log_2 n)$
 - Number of accesses in partition? $O(n)$

Quicksort Analysis

- Assume that keys are random, uniformly distributed.
- Best case running time: $O(n \log_2 n)$

Quicksort Analysis

- Assume that keys are random, uniformly distributed.
- Best case running time: $O(n \log_2 n)$
- Worst case running time?

Summary of Sorting Algorithms

Algorithm	Time	Notes
selection-sort	$O(n^2)$	◆ in-place ◆ slow (good for small inputs)
insertion-sort	$O(n^2)$	◆ in-place ◆ slow (good for small inputs)
quick-sort	$O(n \log n)$ expected	◆ in-place, randomized ◆ fastest (good for large inputs)
heap-sort	$O(n \log n)$	◆ in-place ◆ fast (good for large inputs)
merge-sort	$O(n \log n)$	◆ sequential data access ◆ fast (good for huge inputs)