

# Algoritmos de ordenamiento

Basados en comparación

Estructura de Datos y Algoritmos - TIC3011

1

1

---

---

---


---

---

---

---

## Búsqueda Lineal



--	--	--	--	--	--	--	--

2

---

---

---


---

---

---

---

## Búsqueda Lineal



56	4564	456	45	5	76	56	6
----	------	-----	----	---	----	----	---

3

---

---

---

---

---

---

---

## Búsqueda Binaria (números ordenados)



--	--	--	--	--	--	--	--

4

---

---

---

---

---

---

---

## Búsqueda Binaria (números ordenados)



5	45	68	96	174	398	437	600
---	----	----	----	-----	-----	-----	-----

5

---

---

---

---

---

---

---

## Búsqueda Binaria (palabras ordenadas)



6

---

---

---


---

---

---

---

## Búsqueda Binaria



¿Qué número entre 1 y 64 estoy pensando?  
Si adivinas antes del 6<sup>to</sup> intento, ¡ganas!

7

---

---

---

---

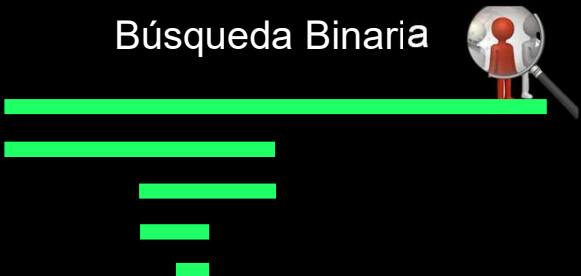
---

---

---

---

## Búsqueda Binaria



El tamaño del espacio de búsqueda disminuye a la mitad en cada iteración => bastan  $\log_2 n$  iteraciones

8

---

---

---

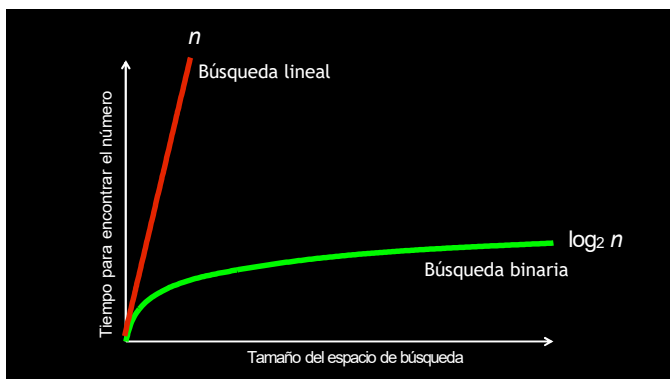
---

---

---

---

---



9

---

---

---

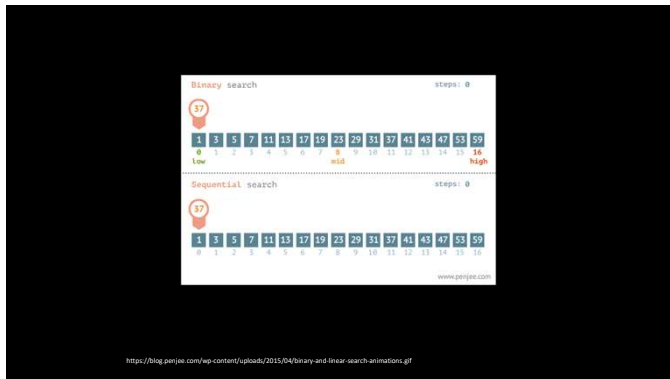
---

---

---

---

---



10

---

---

---

---

---

---

---

---

Para poder usar búsqueda binaria,  
los **datos deben estar ordenados**

11

---

---

---

---

---

---

---

---

Algoritmos de ordenamiento



12

---

---

---

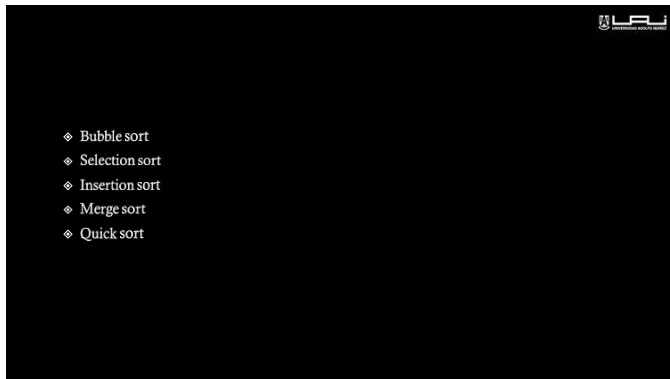
---

---

---

---

---



13

---

---

---

---

---

---

---

---



14

---

---

---

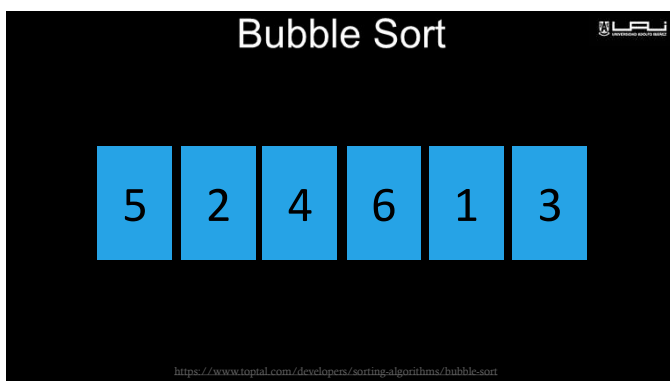
---

---

---

---

---



15

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

16

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

17

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

18

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/selection-sort>

19

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

20

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

21

---

---

---

---

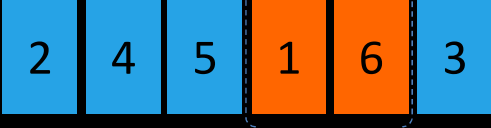
---

---

---

---

### Bubble Sort



A horizontal array of six numbers: 2, 4, 5, 1, 6, 3. The numbers 2, 4, and 5 are in blue boxes. The numbers 1 and 6 are in orange boxes and are enclosed in a dashed-line bracket, indicating they are the current pair being compared. The number 3 is in a blue box.

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

22

---

---

---

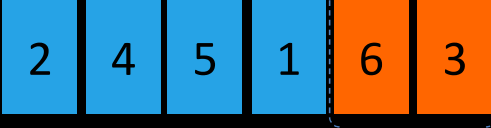
---

---

---

---

### Bubble Sort



A horizontal array of six numbers: 2, 4, 5, 1, 6, 3. The numbers 2, 4, 5, and 1 are in blue boxes. The numbers 6 and 3 are in orange boxes and are enclosed in a dashed-line bracket, indicating they are the current pair being compared.

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

23

---

---

---

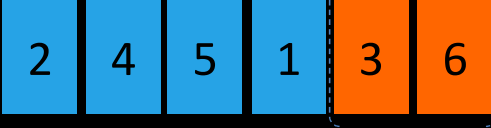
---

---

---

---

### Bubble Sort



A horizontal array of six numbers: 2, 4, 5, 1, 3, 6. The numbers 2, 4, 5, and 1 are in blue boxes. The numbers 3 and 6 are in orange boxes and are enclosed in a dashed-line bracket, indicating they are the current pair being compared.

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

24

---

---

---

---

---

---

---



### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

25

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

26

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

27

---

---

---

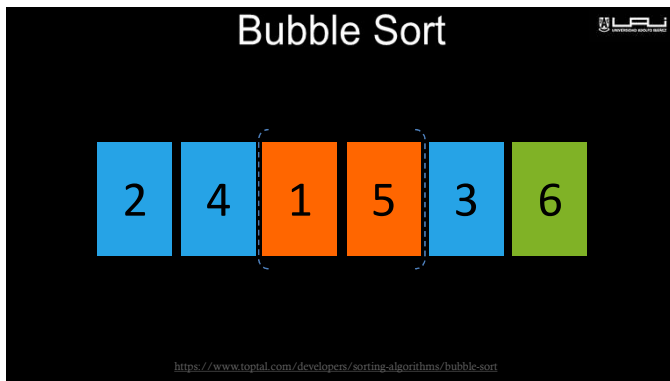
---

---

---

---

---



28

---

---

---

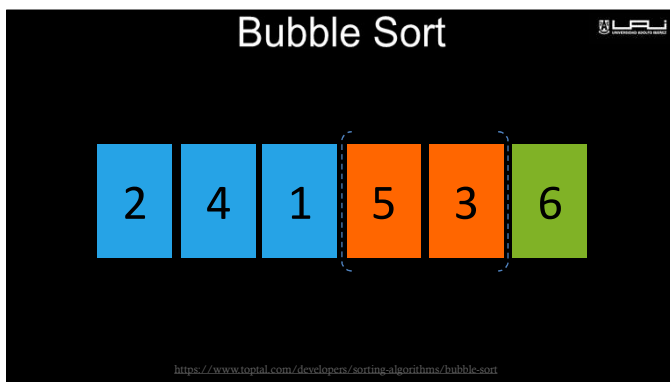
---

---

---

---

---



29

---

---

---

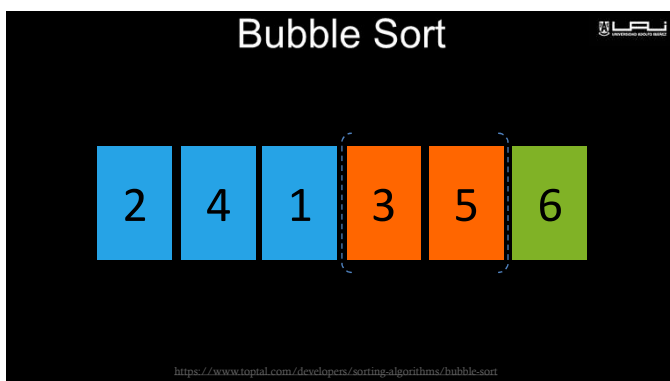
---

---

---

---

---



30

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

31

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

32

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

33

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

34

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

35

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

36

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

37

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

38

---

---

---

---

---

---

---

---

### Bubble Sort

<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

39

---

---

---

---

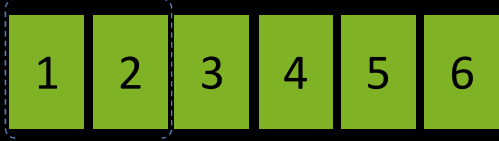
---

---

---

---

### Bubble Sort



<https://www.toptal.com/developers/sorting-algorithms/bubble-sort>

40

---

---

---

---








---

---

---

### Bubble Sort

¿Cuántas comparaciones para N elementos?

		1 <sup>ra</sup> vez: N comparaciones
		2 <sup>da</sup> vez: (N-1) comparaciones (1 <sup>er</sup> elemento ya ordenado)
		3 <sup>ra</sup> vez: (N-2) comparaciones (2 elementos ya ordenados)
		⋮
		(N-1) <sup>a</sup> vez: 1 comparación (N-2 elementos ya ordenados)

41

---

---

---

---


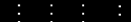
---

---

---

### Bubble Sort

¿Cuántas comparaciones para N elementos?

$$\sum_{i=1}^N (N-i) = N^2/2 - N/2$$

Para N muy grandes, e.g.  $10^6$ :

$$10^{12}/2 + 10^6/2$$

El término  $N^2$  domina el costo.

$O(N^2)$

42

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

**Objetivo**

Sin embargo, deseamos **intercambiar** los valores (swap) para que queden de esta forma

x	y
15	34

43

---

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

**Primera idea**

```
int x= 34;
→ int y= 15;
```

x	y
34	15

```
x= y;
y= x;
```

44

---

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

**Primera idea**

```
int x= 34;
int y= 15;
```

x	y
34	15

```
→ x= y;
y= x;
```

45

---

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

Primera idea

```
int x=34;  
int y=15;  
  
x= y;  
y= x;
```

x	y
15	15

46

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

Segunda idea

```
int x=34;  
int y=15;  
int swp;  
  
swp = x;  
x = y;  
y = swp;
```

x	y	swp
34	15	

creamos una variable de uso temporal

47

---

---

---

---

---

---

---

# Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

Segunda idea

```
int x=34;  
int y=15;  
int swp;  
  
swp = x;  
x = y;  
y = swp;
```

x	y	swp
34	15	34

48

---

---

---

---

---

---

---



## Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

### Segunda idea

```
int x=34;  
int y=15;  
int swp;
```

x	y	swp
15	15	34

```
swp = x;  
x = y;  
y = swp;
```

49

---

---

---

---

---

---

---

## Swap

Suponga que tenemos dos variables (x,y) con los siguientes valores

x	y
34	15

### Segunda idea

```
int x=34;  
int y=15;  
int swp;
```

x	y	swp
15	34	34

```
swp = x;  
x = y;  
y = swp;
```

50

---

---

---

---

---

---

---

## Selection sort



51

51

---

---

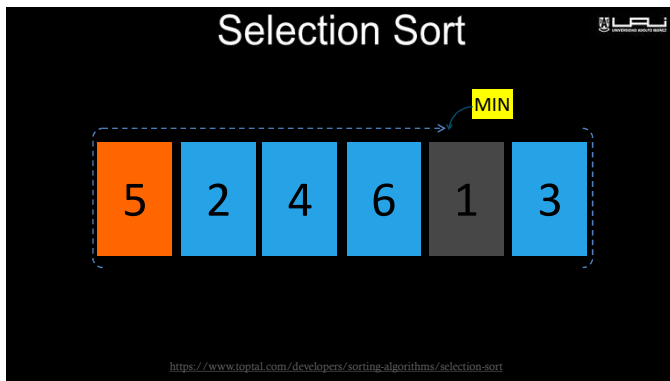
---

---

---

---

---



52

---

---

---

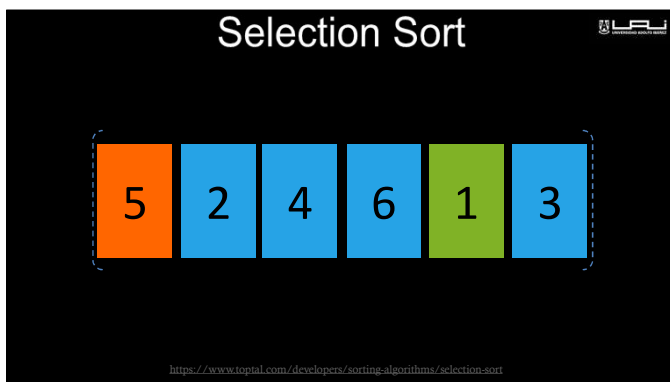
---

---

---

---

---



53

---

---

---

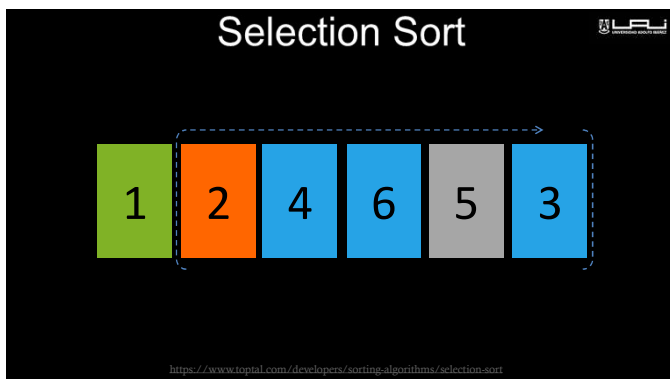
---

---

---

---

---



54

---

---

---

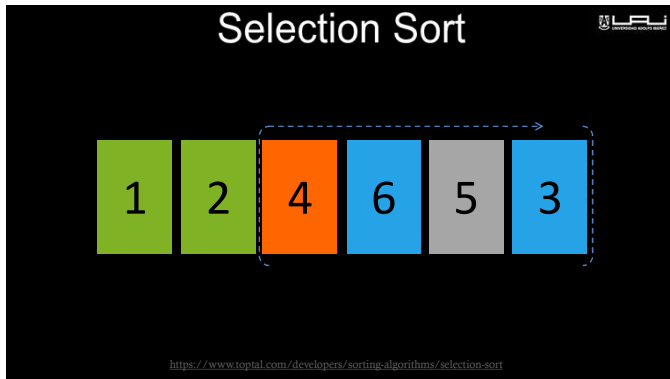
---

---

---

---

---



55

---

---

---

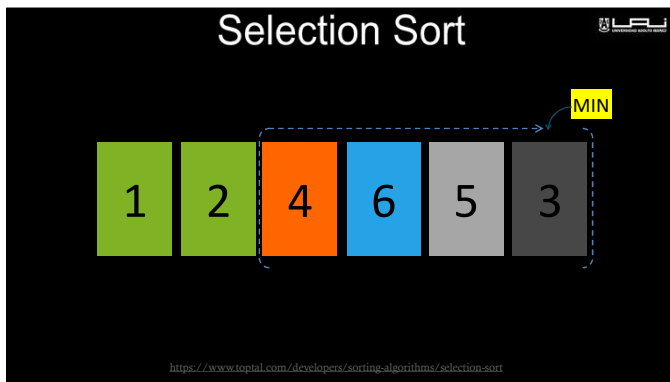
---

---

---

---

---



56

---

---

---

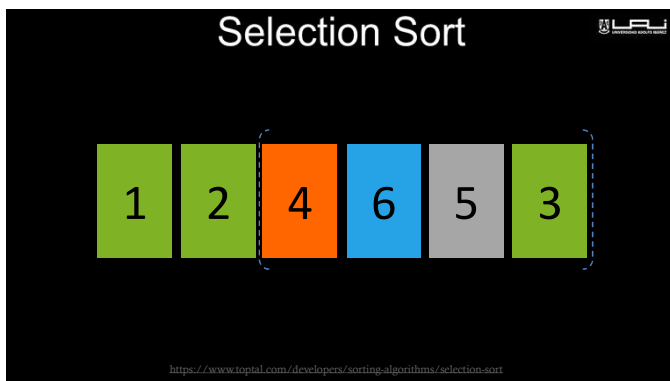
---

---

---

---

---



57

---

---

---

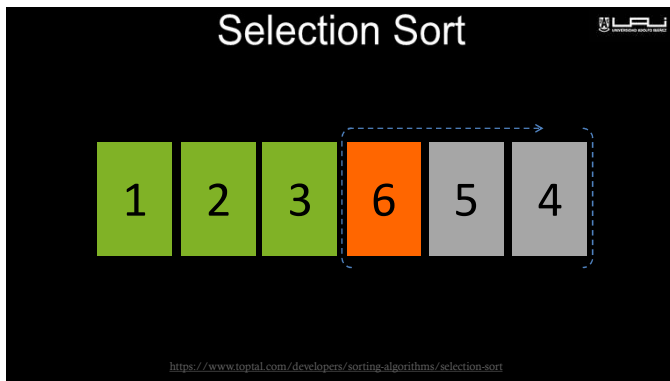
---

---

---

---

---



58

---

---

---

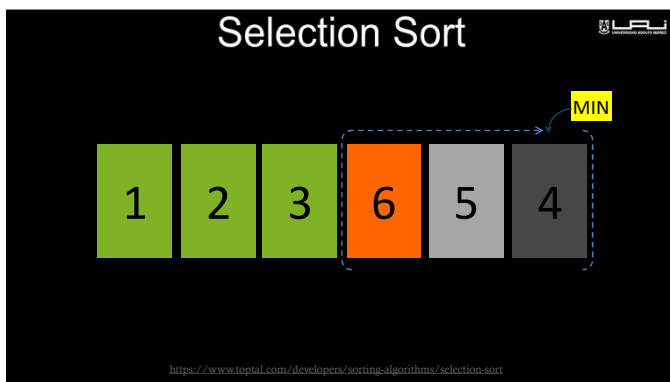
---

---

---

---

---



59

---

---

---

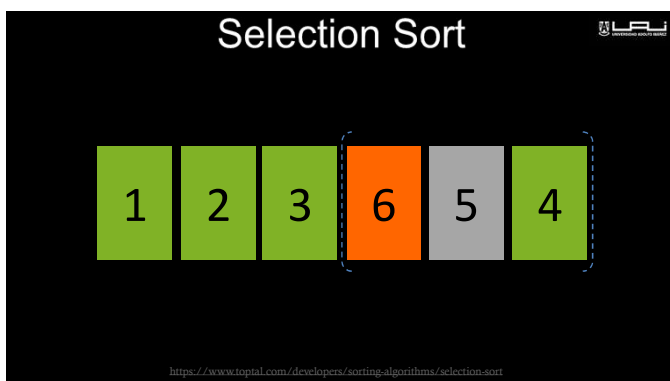
---

---

---

---

---



60

---

---

---

---

---

---

---

---

## Selection Sort

<https://www.toptal.com/developers/sorting-algorithms/selection-sort>

61

---

---

---

---

---

---

---

---

## Selection Sort

¿Cuántas comparaciones para N elementos?

	1 <sup>ra</sup> vez: N comparaciones
	2 <sup>da</sup> vez: (N-1) comparaciones (1 <sup>er</sup> elemento ya ordenado)
	3 <sup>ra</sup> vez: (N-2) comparaciones (2 elementos ya ordenados)
	(N-1) <sup>a</sup> vez: 1 comparación (N-2 elementos ya ordenados)

62

---

---

---

---

---

---

---

---

## Selection Sort

¿Cuántas comparaciones para N elementos?

		$\sum_{i=1}^N (N-i+1) = N^2/2 + N/2$ <p>Para N muy grandes, e.g. <math>10^6</math>:</p> $10^{12}/2 + 10^6/2$ <p>El término <math>N^2</math> domina el costo.</p> <p style="color: yellow;"><math>O(N^2)</math></p>

63

---

---

---

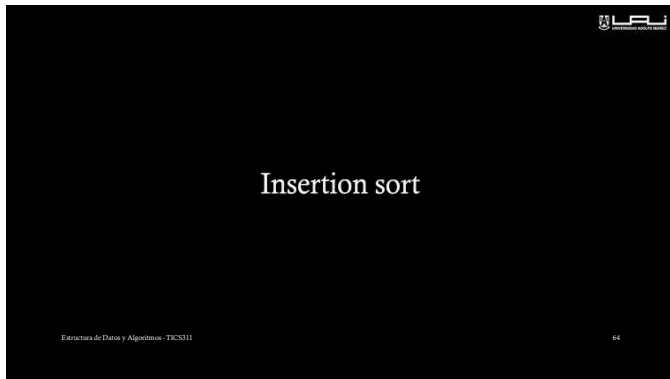
---

---

---

---

---



64

---

---

---

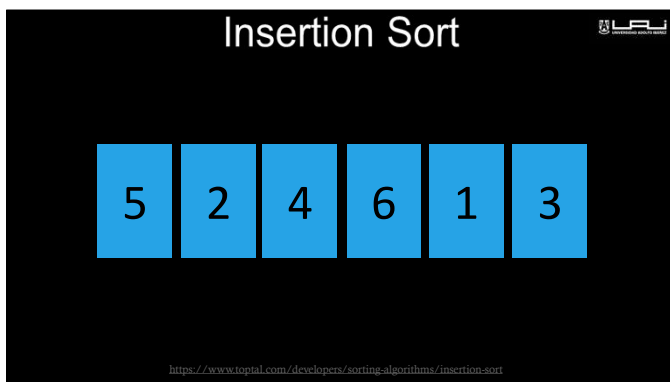
---

---

---

---

---



65

---

---

---

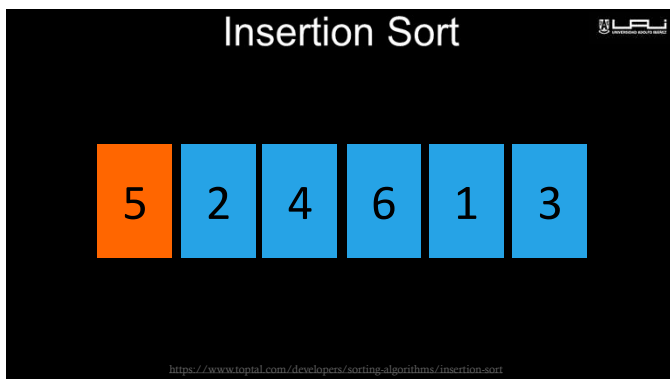
---

---

---

---

---



66

---

---

---

---

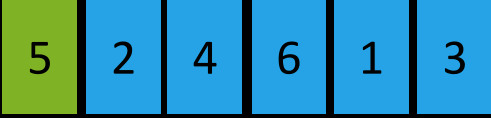
---

---

---

---

### Insertion Sort



<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

67

---

---

---

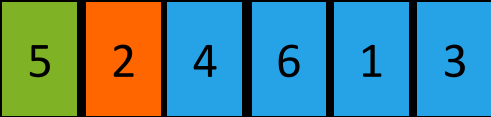
---

---

---

---

### Insertion Sort



<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

68

---

---

---

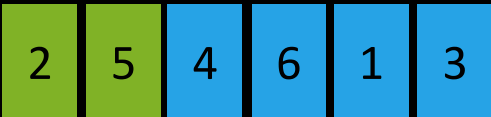
---

---

---

---

### Insertion Sort



<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

69

---

---

---


---

---

---

---

### Insertion Sort



2 5 4 6 1 3

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

70

---

---

---


---

---

---

---

### Insertion Sort



2 4 5 6 1 3

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

71

---

---

---


---

---

---

---

### Insertion Sort



2 4 5 6 1 3

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

72

---

---

---

---

---

---

---



### Insertion Sort

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

73

---

---

---

---

---

---

---

### Insertion Sort

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

74

---

---

---

---

---

---

---

### Insertion Sort

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

75

---

---

---

---

---

---

---

## Insertion Sort

1

2

4

5

6

3

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

76

---

---

---

---

---

---

---

---

## Insertion Sort

1

2

3

4

5

6

<https://www.toptal.com/developers/sorting-algorithms/insertion-sort>

77

---

---

---

---

---

---

---

---

## Insertion Sort

¿Cuántas comparaciones para N elementos?

<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div>	<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div> <p>1<sup>ra</sup> vez: 1 comparaciones</p>
<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div>	<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div> <p>2<sup>da</sup> vez: (2) comparaciones (1<sup>er</sup> elemento ya ordenado)</p>
<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div>	<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div> <p>3<sup>ra</sup> vez: (3) comparaciones (2 elementos ya ordenados)</p>
<div style="display: flex; gap: 5px;"> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> </div>	<div style="display: flex; gap: 5px;"> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 10px; height: 10px; background-color: white; border: 1px solid black;"></div> </div>
<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: #90EE90; border: 1px solid black;"></div> </div>	<div style="display: flex; gap: 5px;"> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> <div style="width: 20px; height: 10px; background-color: white; border: 1px solid black;"></div> </div> <p>(N-1)<sup>a</sup> vez: N-1 comparación (N-2 elementos ya ordenados)</p>

78

---

---

---

---

---


---

---

---

## Insertion Sort

¿Cuántas comparaciones para N elementos?



$$\sum_{i=1}^N (N-i+1) = N^2/2 + N/2$$

Para N muy grandes, e.g.  $10^6$ :

$$10^{12}/2 + 10^6/2$$

El término  $N^2$  domina el costo.

$O(N^2)$

79

---

---

---

---

---

---

---

---

## Merge sort

Estructura de Datos y Algoritmos - TIC3011

80

---

---

---

---

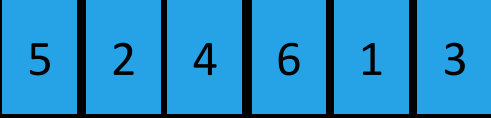
---

---

---

---

## Merge Sort



<https://www.toptal.com/developers/sorting-algorithms/merge-sort>

81

---

---

---

---

---

---

---

---

Merge Sort

524613

<https://www.topical.com/developers/sorting-algorithms/merge-sort>

82

---

---

---

---

---

---

---

Merge Sort

524613

524613

<https://www.topical.com/developers/sorting-algorithms/merge-sort>

83

---

---

---

---

---

---

---

Merge Sort

524613

524613

524613

<https://www.topical.com/developers/sorting-algorithms/merge-sort>

84

---

---

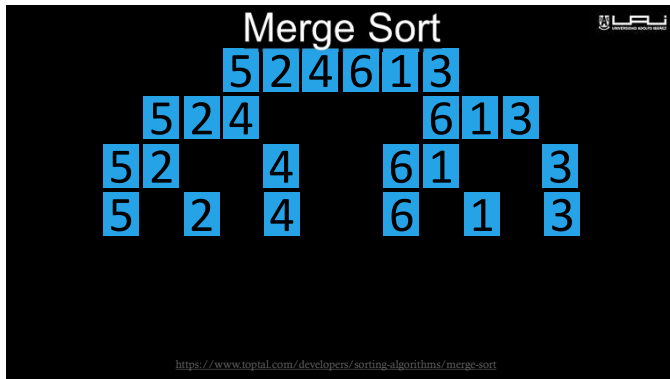
---

---

---

---

---



85

---

---

---

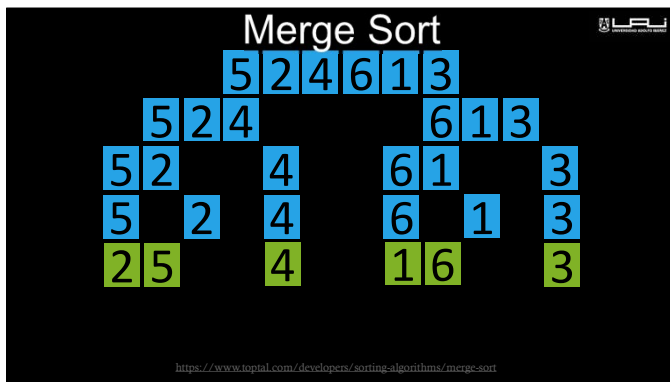
---

---

---

---

---



86

---

---

---

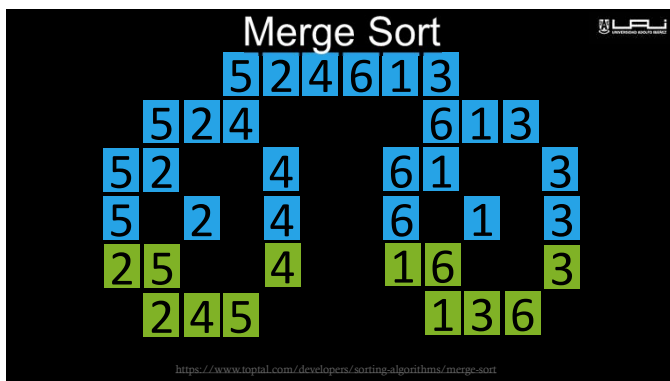
---

---

---

---

---



87

---

---

---

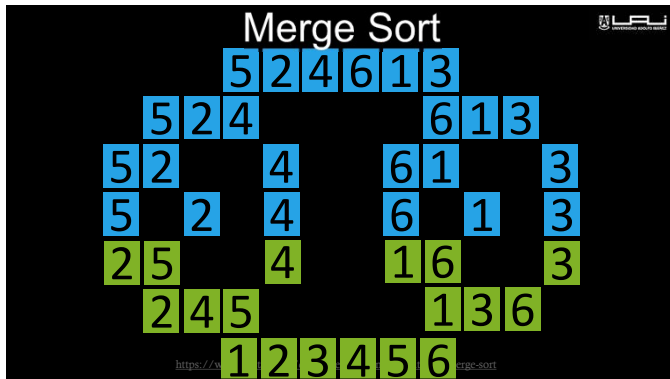
---

---

---

---

---



88

---

---

---

---

---

---

---

---

**Merge Sort**

¿Cuántas comparaciones para N elementos?

- ◆  $\log_2 n$  niveles antes de empezar a comparar
- ◆ En nivel  $\log_2 n + 1$  hay  $n/2$  comparaciones (1 por cada subgrupo,  $n/2$  subgrupos)
- ◆ En nivel  $\log_2 n + 2$  hay  $3n/4$  (3 por cada subgrupo,  $n/4$  subgrupos)
- ◆ nivel  $\log_2 n + 3$  hay  $7n/8$  (7 por cada subgrupo,  $n/8$  subgrupos)
- ◆ Suponiendo  $l$  niveles de comparación:

$$\frac{n}{2} + \frac{3n}{2} + \frac{7n}{2} + \dots = \sum_{i=1}^l \frac{(2^i - 1)n}{2^i}$$

$$\lceil n \log_2 n - n + 1 \rceil$$

Para N muy grandes, e.g.  $10^6$ :

$10^6 \log 10^6 - 10^6 + 1$

El término  $n \log n$  domina el costo.

**$O(n \log n)$**

89

---

---

---

---

---

---

---

---

**Quick sort**

Estructura de Datos y Algoritmos - TICS311

90

90

---

---

---

---

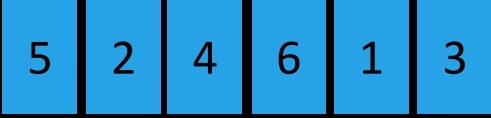
---

---

---

---

### Quick Sort



The array contains the numbers 5, 2, 4, 6, 1, and 3. The first element, 5, is the pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

91

---

---

---

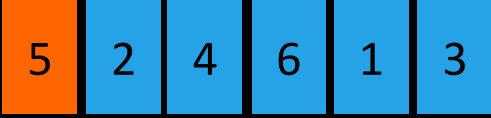
---

---

---

---

### Quick Sort



The array contains the numbers 5, 2, 4, 6, 1, and 3. The first element, 5, is the pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

92

---

---

---

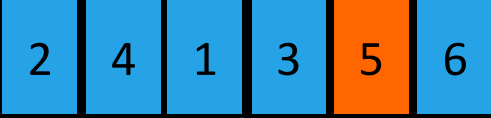
---

---

---

---

### Quick Sort



The array contains the numbers 2, 4, 1, 3, 5, and 6. The first element, 2, is the pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

93

---

---

---

---

---

---

---

### Quick Sort

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

94

---

---

---

---

---

---

---

---

### Quick Sort

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

95

---

---

---

---

---

---

---

---

### Quick Sort

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

96

---

---

---

---

---


---

---

---



### Quick Sort



A horizontal array of six colored boxes containing the numbers 1, 2, 4, 3, 5, and 6. The boxes are colored green, green, orange, blue, green, and blue respectively. The number 4 is in an orange box, indicating it is the current pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

97

---

---

---


---

---

---

---

### Quick Sort



A horizontal array of six colored boxes containing the numbers 1, 2, 3, 4, 5, and 6. The boxes are colored green, green, blue, orange, green, and blue respectively. The number 4 is in an orange box, indicating it is the current pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

98

---

---

---


---

---

---

---

### Quick Sort



A horizontal array of six colored boxes containing the numbers 1, 2, 3, 4, 5, and 6. The boxes are colored green, green, orange, green, green, and blue respectively. The number 3 is in an orange box, indicating it is the current pivot.

<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

99

---

---

---

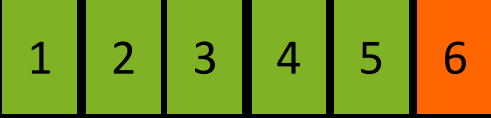
---

---

---

---

Quick Sort



<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

100

---

---

---

---

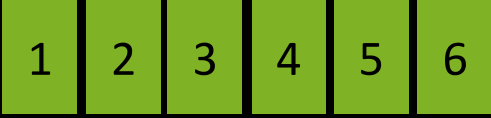
---

---

---

---

Quick Sort



<https://www.toptal.com/developers/sorting-algorithms/quick-sort>

101

---

---

---

---

---

---

---

---

Quick Sort

¿Cuántas comparaciones para N elementos?

TAREA (no evaluada como tarea)

102

---

---

---

---

---

---

---

---