(What are Algorithms and How to Analyze Algorithms)

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- Sorting
- 2 Bubble Sort
- 3 Analysis

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Sorting

The sorting problem:

Input: A sequence A of n integers $a_1 a_2 \cdots a_n$.

Output: A permutation $a'_1 a'_2 \dots a'_n$ of A s.t.

 $a_1' \le a_2' \le \cdots \le a_n'$ (non-decreasing order).

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 $3142 \Longrightarrow 1234$



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■ CAS¹ for sort: compare and swap if out-of-order

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If i < j and $a_i > a_j$, then (a_i, a_j) is an **inversion**.



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 $A ext{ is sorted} \implies A ext{ has no inversions}$



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Basic idea: to eliminate all adjacent inversions

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1: procedure BUBBLESORTOVERVIEW(A: a_1 \ a_2 \cdots a_n)
2: repeat
3: Pick any i
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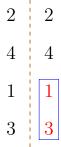
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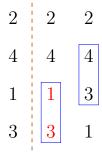
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```
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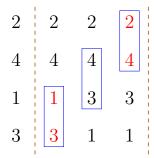
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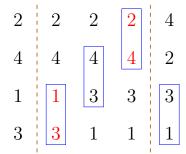
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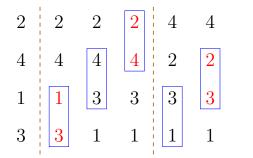
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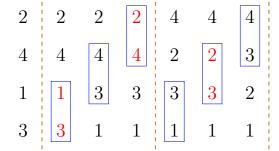
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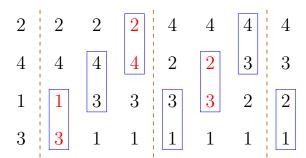




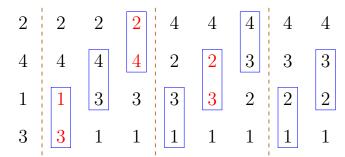
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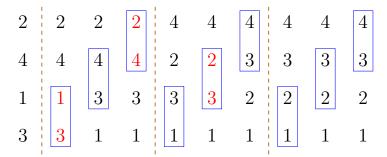
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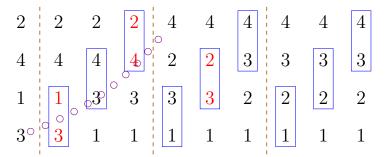


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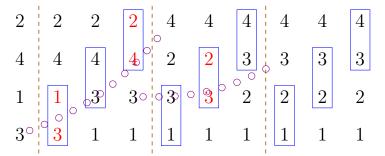


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1) \exists loop : no swaps \Longrightarrow swapped = false \Longrightarrow terminates

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The inner "for" loops:

- 1) \exists loop : no swaps \Longrightarrow swapped = false \Longrightarrow terminates
- 2) \forall loop: has swaps Impossible!

Effects of SWAP (a_i, a_{i+1}) on adjacent inversions:

$$5 \quad 3 \quad 1 \quad 6 \quad 7 \quad 2 \quad 4 \quad 8$$
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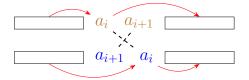
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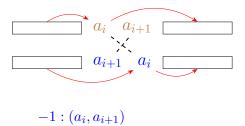
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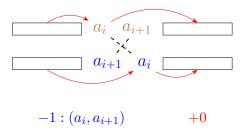
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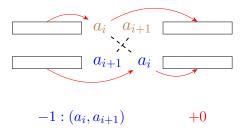
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Total #inversions is finite.

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Finiteness



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Loop invariant:

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Before the k-th (k \ge 1) "for" loop, a_{n-(k-1)} \cdots a_n (1) consists of the largest (k-1) elements (2) in sorted order.
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Correctness: Initialization + Maintenance + Termination

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1: procedure BubbleSort(A: a_1 \ a_2 \ \cdots \ a_n)
         n \leftarrow \operatorname{len}(A)
 2:
         repeat
 3:
             swapped \leftarrow false
 4:
             for i \leftarrow 1 : n - 1 do
 5:
                  if a_i > a_{i+1} then
 6:
                      SWAP(a_i, a_{i+1})
 7:
                      swapped \leftarrow true
 8:
                                                       ▶ One maximal bubbles up
             n \leftarrow n-1
 9:
         until swapped = false
10:
```

```
3 1 4 2 5 6 7
1 3 2 4 5 6 7
```

```
1: procedure BUBBLESORT(A: a_1 \ a_2 \ \cdots \ a_n)
 2:
        repeat
             swapped \leftarrow false
 3:
             lsp \leftarrow 0 \triangleright lsp: the last swap position
4:
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8:
                      lsp \leftarrow i
                                                      ▶ Update lsp
9:
             n \leftarrow \text{lsp} \triangleright Elements after lsp are sorted
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       until n = 0
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Bubble Sort

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- Different inputs ⇒ different execution time:
 - Best-case, worst-case, and average-case analysis

	Best-case:	Worst-case:
P	= ();
C	= ();
S	= ().

Best-case: 1 2 3 4 5 6 7 8

	Best-case: ascendingly sorted	Worst-case:
P	= ();
	= ();
S	= ().

Best-case: 1 2 3 4 5 6 7 8

	Best-case: ascendingly sorted	Worst-case:
P	$= (\min: 1,$);
C	$= (\min: n-1,$);
S	$= (\min: 0,$).

Best-case: 1 2 3 4 5 6 7 8

Worst-case: 8 7 6 5 4 3 2 1

Best-case: 1 2 3 4 5 6 7 8

	Best-case: ascendingly sorted	$\frac{\text{Worst-case:}}{\text{descendingly sorted}}$
P	$= (\min: 1,$	$\max: n);$
C	$= (\min: n-1,$	$\max: \frac{n^2 - n}{2});$
S	$= (\min:0,$	$\max: \frac{n^2 - n}{2}).$

Worst-case: 8 7 6 5 4 3 2 1



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Question: What is the expected #inversions?

 I_{ij} : indicator of inversion (a_i, a_j)



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$$X = \sum_{j} \sum_{i < j} I_{ij}$$



$$I_{ij}$$
: indicator of inversion (a_i, a_j)

$$X = \sum_{j} \sum_{i < j} I_{ij}$$

$$E(X) = E(\sum_{j} \sum_{i < j} I_{ij}) = \sum_{j} \sum_{i < j} E(I_{ij})$$

 $I_{ij} : \text{indicator of inversion } (a_i, a_j)$ $X = \sum_j \sum_{i < j} I_{ij}$ $E(X) = E(\sum_j \sum_{i < j} I_{ij}) = \sum_j \sum_{i < j} E(I_{ij})$ $E(I_{ij}) = P\{I_{ij}\} = \frac{1}{2}$



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$$E(X) = \sum_j \sum_{i < j} \frac{1}{2} = \binom{n}{2} \cdot \frac{1}{2} = \frac{n(n-1)}{4}$$

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