



**ITMO UNIVERSITY**

# **How to Win Coding Competitions: Secrets of Champions**

## **Week 3: Sorting and Search Algorithms** **Lecture 5: Quicksort Modifications**

**Maxim Buzdalov**  
**Saint Petersburg 2016**

```
procedure QUICKSORT( $A, \prec, s, e$ )  
   $s' \leftarrow s, e' \leftarrow e, M \leftarrow A[(s + e)/2]$   
  while  $s' \leq e'$  do  
    while  $A[s'] \prec M$  do  $s' \leftarrow s' + 1$  end while  
    while  $M \prec A[e']$  do  $e' \leftarrow e' - 1$  end while  
    if  $s' \leq e'$  then  
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Recall quicksort. . .

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Why using  $(s + e)/2$ ?

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- ▶ But this choice leads to  $\Theta(N^2)$  on sorted arrays!
- ▶  $(s + e)/2$  makes it fast on such arrays
- ▶ But is it the only choice?

```
procedure QUICKSORT( $A, \prec, s, e$ )  
   $s' \leftarrow s, e' \leftarrow e, M \leftarrow A[\text{RANDOM}(s, e)]$   
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Modification: **Random pivot**



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Modification: Random pivot

- Turns average  $O(N \log N)$  time on random input into **expected**  $O(N \log N)$  time on **any input**

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- ▶ Turns average  $O(N \log N)$  time on random input into **expected**  $O(N \log N)$  time on **any input**
- ▶ Only  $O(N)$  queries to random number generator

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- ▶ Turns average  $O(N \log N)$  time on random input into **expected**  $O(N \log N)$  time on **any input**
- ▶ Only  $O(N)$  queries to random number generator
- ▶ Efficient in practice

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### $K$ -th order statistic:

- Find what will be the  $k$ -th element of the array, if it was sorted

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### $K$ -th order statistic:

- ▶ Find what will be the  $k$ -th element of the array, if it was sorted
- ▶ Faster than sorting!

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procedure QUICKSORT( $A, \prec, s, e$ )  
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Solution: **Modify quicksort!**

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Solution: **Modify quicksort!**

- ▶ Run only half of it!
- ▶ Don't sort the part which is not needed

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procedure QUICKSORT( $A, \prec, s, e, k$ )
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  if  $s \leq e'$  and  $k \leq e'$  then QUICKSORT( $A, \prec, s, e', k$ ) end if
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Solution: **Modify quicksort!**

- ▶ Run only half of it!
  - ▶ Don't sort the part which is not needed
- ▶ Running time:  $\Theta(N)$  in expectation
  - ▶ Array size reduction as in quicksort