

# Implementation of algorithms and data structures

## 4. seminar

Jirka Fink

<https://ktiml.mff.cuni.cz/~fink/>

Department of Theoretical Computer Science and Mathematical Logic  
Faculty of Mathematics and Physics  
Charles University in Prague

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- When a program returns an incorrect result, how do we find a bug?
- A unit test gives us input to reproduce an error but only limited information where the bug is.
- For data structures, we can test their internal structure after every operation.
- Can we verify results of intermediate steps of an algorithm?
- Can we also verify intermediate states of data structure during complex operation?

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2   stack = [(1,n)]
3   while(stack is non-empty) {
4     i,j = stack.pop()
5     m = choose_pivot_and_split(a,i,j)
6     test_split(a,i,j)
7     if(i < m) stack.push((i,m))
8     if(m+1 < j) stack.push((m+1,j))
9     test_stack(a, stack)
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- $i \leq m \leq j$
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- $stack[z][1] < stack[z][2] < stack[z + 1][1]$  for every  $z$  in the stack (except last)
- When we replace every subarray  $stack[z][1] \dots stack[z][2]$  by its minimal and maximal elements, the resulting array must be sorted

- Quicksort, Mergesort, Heapsort
- Knuth-Morris-Pratt, Aho-Corasick
- Shortest path
- Minimum spanning tree
- Maximum flow (Ford-Fulkerson, Dinic)
- Red-black trees

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- Integer linear programming
  - Variables are real numbers
  - Constraints are linear inequalities

- Possible problems
  - A solver finds a solution not satisfying our conditions
  - A solver claims that our model has no solution, although we have one
  - An ILP solver finds a suboptimal solution
- How to find the bug and write tests?