Effective Test Generation for Worst-Case Execution Time

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Real-Time Systems Group





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 - Real-Time Systems
 - Worst-Case Execution Time Problem
- On-going Research
 - Test-Generation Techniques
 - Experimental Results
- Collaboration
- References



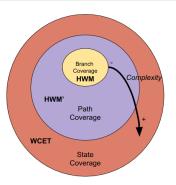
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WCET



- WCET problem is generally an intractable problem and therefore the WCET is generally unknown.
- In its absence any method to derive it must gives confidence that its results are close to it. *Underestimation* is normally deemed a more **hazardous** situation whereas a non-overly pessimistic upper-bound is considered ideal.

Measurement-Based or Hybrid Approach

- It collects end-to-end measurements from the actual hardware or an equivalent simulator.
- It is prone to underestimate although it doesn't need to model hardware.
- This approach is only applicable if proper test data are supplied to evaluate the performance

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Research Question

How do we generate test data for the WCET automatically?

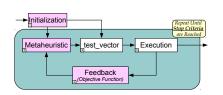
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- Manually generated test data is often the practice in the industry.
- From a certain point of view the WCET can be considered an optimization problem
- Artificial Intelligence offers promising areas to address such a problems: Meta-heuristics, Constraint-Satisfaction Problems



Search-Based Testing



```
procedure test_foo
    (x, y : in My_Int)
    is
    begin

if x - y = 0 then
        Status := Still;
    end if;

end test_foo;
```

Listing 1: Pathological case of Search-Based Testing

Constraint-Based Testing

- It is able to handle discrete search space.
- Industrial Cases of successful application, e.g., SAGE, Microsoft [2].
- NP-hard solving algorithms

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InsertionSort Algorithm with an array of 100 items



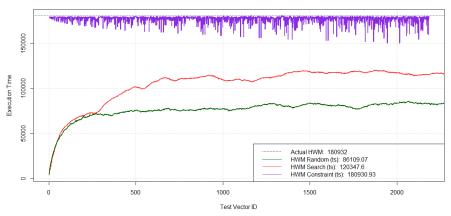


Figure 2: Time series displaying the average of each test generator in each trial. HWM denotes High Water Mark (Maximum observed execution time)

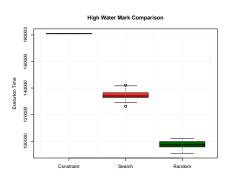


Figure 3: Comparison of the distribution of the HWM of each test generator and trial

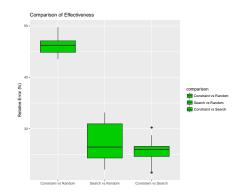


Figure 4: Comparison of the difference in HWM distribution of previous plot. Green plot indicates statistical significance from the Wilcoxon-Nemenyi-McDonald-Thompson test

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What I may offer

- Framework to test new meta-heuristics (test generators) and/or objective functions for a real-world intractable problem with a discrete search space.
- Spark Ada benchmarks for case of study.
- Help with SCIP: An open source constraint solver.
- Help with R environment and application of Statistics of Extremes.

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What I'd be interesting in collaborating with

- Test <u>case</u> generation and other ways of extrapolating Constraint-Based Testing to functional testing. This includes ways of reading formal specifications.
- Test generation for cyber security.
- More sophisticated meta-heuristic application., e.g., hyper-heuristics.
- Ada, C, and C++ Abstract Interpretation and parsing.

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Any questions?

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Reinhard Wilhelm, Jakob Engblom, Andreas Ermedahl, Niklas Holsti, Stephan Thesing, David Whalley, Guillem Bernat, Christian Ferdinand, Reinhold Heckmann, Tulika Mitra, et al.

The worst-case execution-time problem—overview of methods and survey of tools.

ACM Transactions on Embedded Computing Systems (TECS), 7(3):36, 2008.



Patrice Godefroid, Michael Y. Levin, and David Molnar.

Sage: Whitebox fuzzing for security testing. *Queue*, 10(1):20:20–20:27, January 2012.