

Parameter Tuning for Search-Based Test-Data Generation Revisited

Support for Previous Results

Anton Kotelyanskii

Gregory M. Kapfhammer

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Software Testing

Software Testing

Test Suites

Software Testing

Test Suites

Automatic Generation

Software Testing

Test Suites

Automatic Generation

Confronting Challenges

Software Testing

Test Suites

Automatic Generation

Confronting Challenges

Evaluation Strategies

Empirical Studies

Empirical Studies

Challenges

Empirical Studies

Challenges
Importance

Empirical Studies

Challenges

Importance

Replication

Empirical Studies

Challenges

Importance

Replication

Rarity



EvoSuite

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Amazing test suite generator

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Uses a genetic algorithm

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Input: A Java class

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<http://www.evosuite.org/>

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Parameter Tuning

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RSM: Response surface methodology

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SPOT: Sequential parameter optimization toolbox

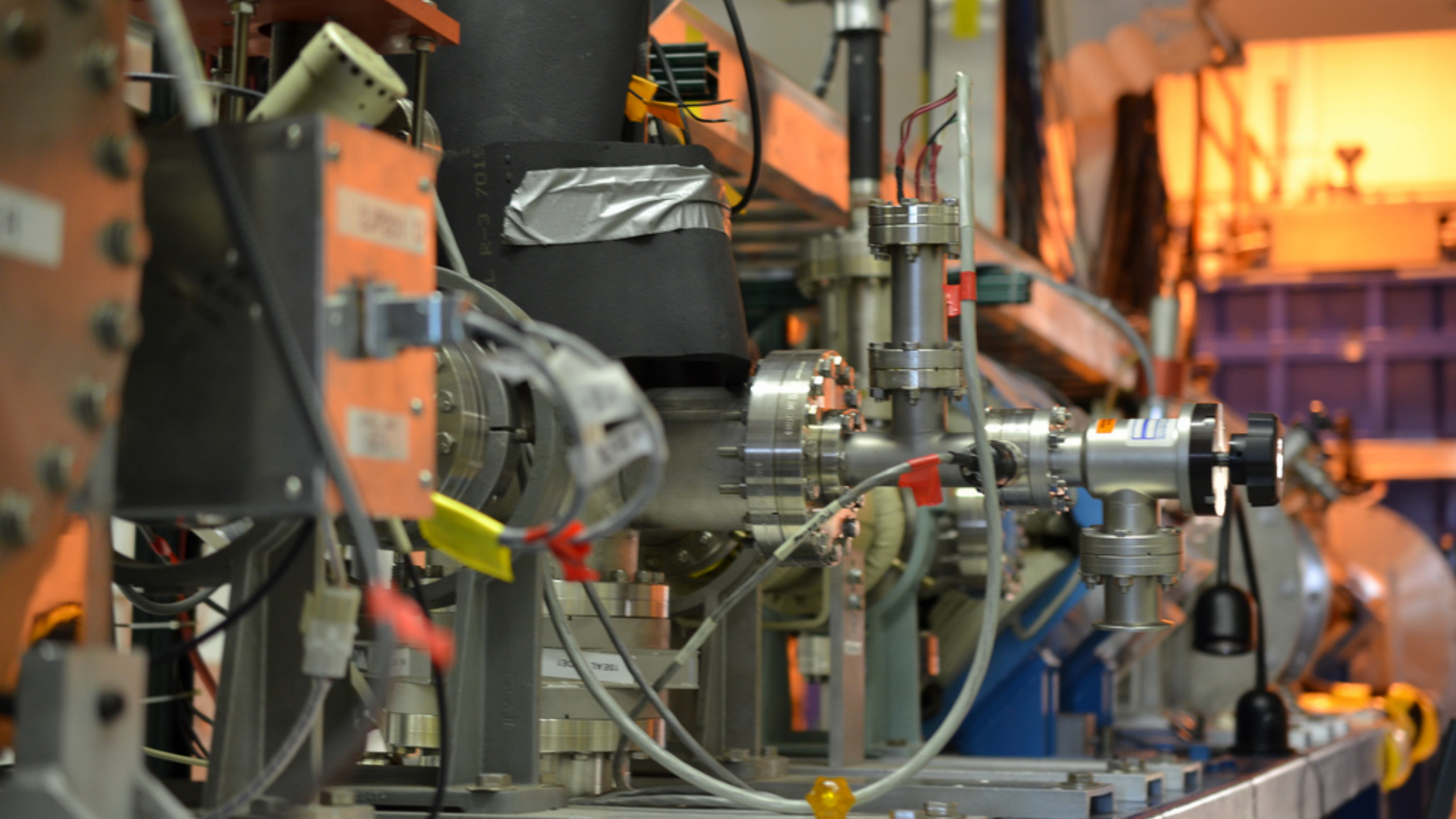
Parameter Tuning

RSM: Response surface methodology

SPOT: Sequential parameter optimization toolbox

Successfully applied to many diverse problems!

Defaults or
Tuned Values?



Experiment Design

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Experiment Design

Eight EvoSuite parameters

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Ten projects from SF100

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475 Java classes for subjects

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100 trials after parameter tuning

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475 Java classes for subjects

100 trials after parameter tuning

Aiming to improve statement coverage

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Parameters

Parameter Name	Minimum	Maximum
Population Size	5	99
Chromosome Length	5	99
Rank Bias	1.01	1.99
Number of Mutations	1	10
Max Initial Test Count	1	10
Crossover Rate	0.01	0.99
Constant Pool Use Probability	0.01	0.99
Test Insertion Probability	0.01	0.99

Experiments

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184 days of computation time estimated

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Cluster of 70 computers running for weeks

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Identified 139 "easy" and 21 "hard" classes

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Mann-Whitney U-test *and*

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Mann-Whitney U-test *and*

Vargha-Delaney effect size

Results

Category	Effect Size	p-value
Results Across Trials and Classes	0.5029	0.1045
No "Easy" and "Hard" Classes	0.5048	0.0314

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Testing shows we do not *always* reject the null hypothesis
Additional empirical results in the QSIC 2014 paper!



Discussion

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Tuning improved scores for 11 classes

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Additional details in the QSIC 2014 paper!

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Practical Implications

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Fundamental Challenges

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Fundamental Challenges
Tremendous Confidence

Practical Implications

Fundamental Challenges

Tremendous Confidence

Great Opportunities





Important Contributions

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Important Contributions

Comprehensive Experiments

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Comprehensive Experiments
Conclusive Confirmation

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Important Contributions

Comprehensive Experiments
Conclusive Confirmation
For EvoSuite, *Defaults = Tuned*

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