

Parameter Tuning for Search-Based Test-Data Generation Revisited Support for Previous Results

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Software Testing

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Test Suites

Software Testing

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Automatic Generation

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Automatic Generation
Confronting Challenges

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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

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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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Output: A JUnit test suite

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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

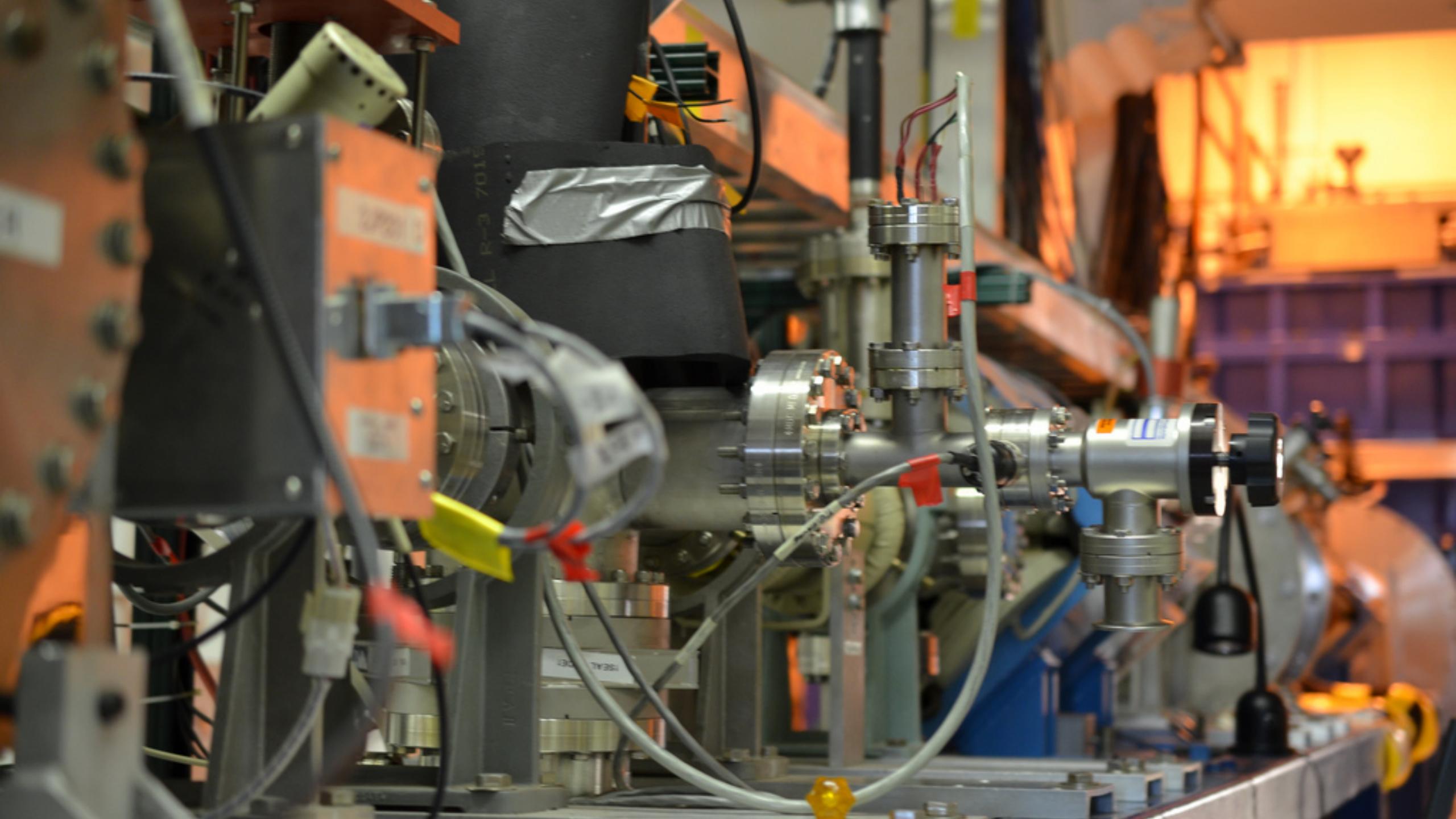
Parameter Tuning

RSM: Response surface methodology

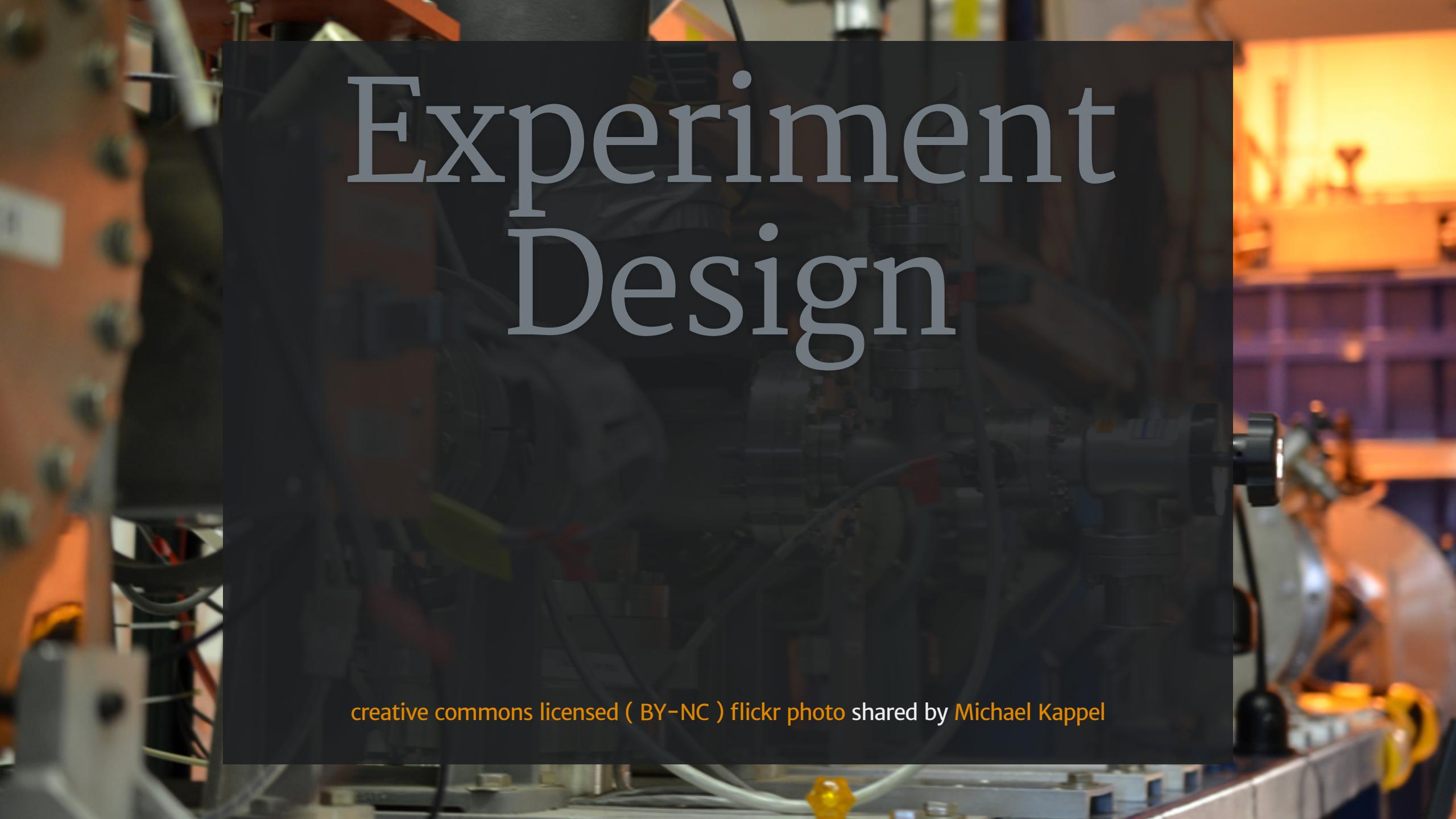
SPOT: Sequential parameter optimization toolbox

Successfully applied to many diverse problems!

Defaults or
Tuned Values?



Experiment Design



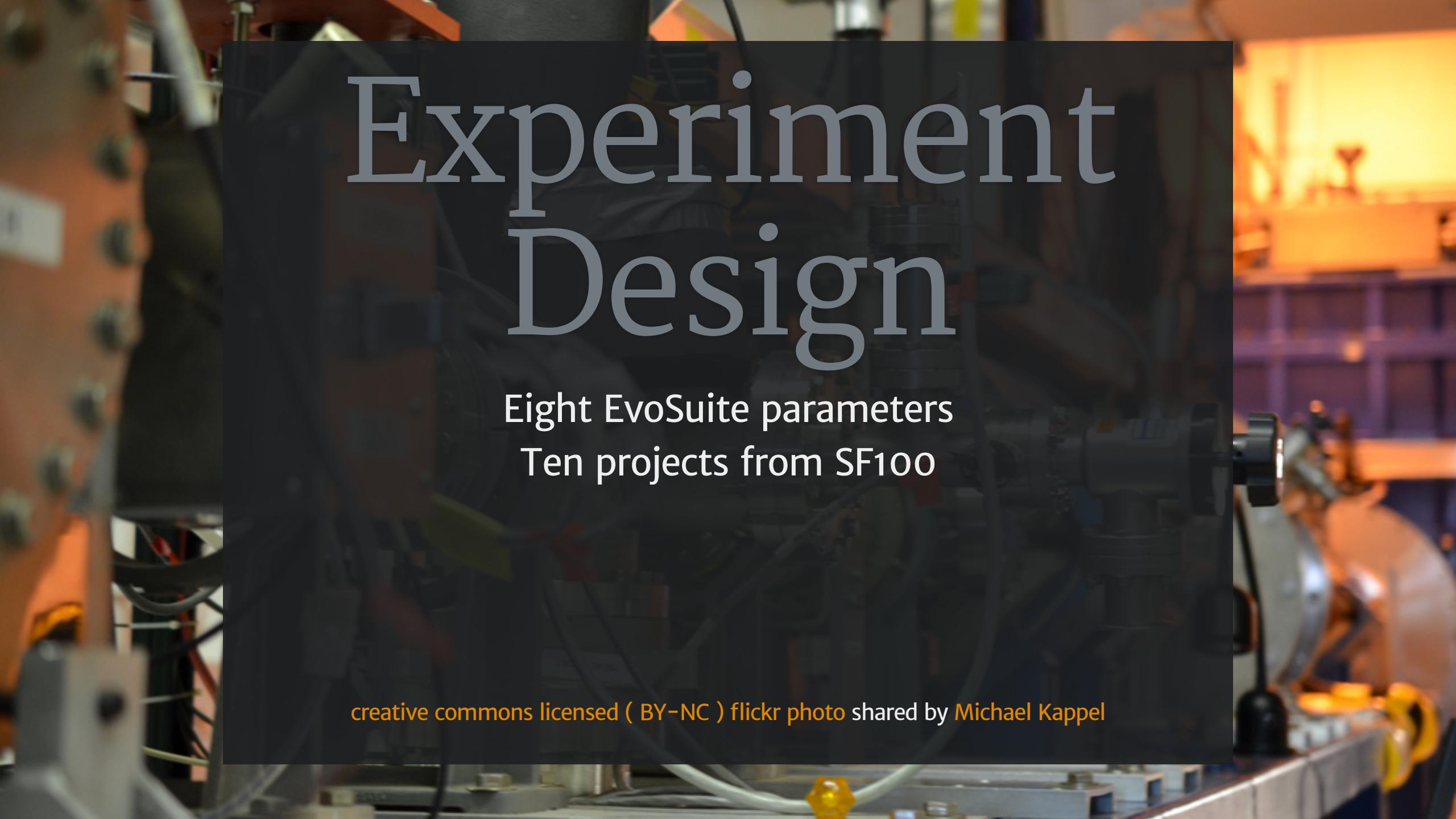
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Experiment Design

Eight EvoSuite parameters

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Experiment Design



Eight EvoSuite parameters
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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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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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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Additional empirical results in the QSIC 2014 paper!



Discussion

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Tuning improved scores for 11 classes

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Practical Implications

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Fundamental Challenges

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Fundamental Challenges
Tremendous Confidence

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Fundamental Challenges
Tremendous Confidence
Great Opportunities



Important Contributions

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Comprehensive Experiments

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Conclusive Confirmation

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Comprehensive Experiments

Conclusive Confirmation

For EvoSuite, *Defaults = Tuned*

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