

Search-Based Software Testing (SBST)

ICSE 2019 Workshop Proposal

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Abstract—There is a growing realization that optimization techniques can be applied to many aspects of the software development process: a research area known as Search-Based Software Engineering (SBSE). Search-Based Software Testing – one of the largest research areas within SBSE – is the process of using search-based optimization algorithms to specifically address problems in software testing. SBST has been applied to a wide variety of testing goals including structural, functional, non-functional and state-based properties. Many approaches to testing and a wide diverse range of development domains have been addressed, including exceptions, interactions, integration, mutation, regression, and web applications.

Work in SBST has developed to the point at which it is now ripe for combination with other areas of software engineering. The common “lingua franca” that makes these combinations possible is the definition of the fitness function that guides a search algorithm. A fitness function is merely a form of a metric, and metrics exist across the entire software engineering spectrum. Therefore, the central objective of this workshop is to bring together researchers and industrial practitioners from SBST and the wider software engineering community to share experience and provide directions for future research, and to encourage the use of search techniques to combine aspects of testing with other aspects of the software engineering lifecycle.

SBST is a two-day workshop aimed at bringing testing researchers together with the broader software engineering community to discuss state-of-the-art work and set new research directions.

I. CONTACT INFORMATION

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II. MOTIVATION AND OBJECTIVES

Search-Based Software Engineering (SBSE) [1] is receiving increasing attention from the SE community thanks to the growing realization that optimization can be applied to many aspects of the software development process. Search-Based Software Testing—the process of using search-based optimization algorithms to specifically address problems in software testing [2]—is one of the largest research areas within SBSE. The potential of SBST to be applied to a vast number of open complex testing problems (e.g., autonomous

driving functions [3]) is increasingly evident. Furthermore, the recent industrial-scale impact of the Sapienz tool [4] at Facebook showcases the capabilities and potential of SBST and helps as motivation for the community to continue to work on SBST techniques and tools.

Some of the specific topics to be explored in the workshop include:

Multi-Objective Solutions. SBST can use many fitness functions at once, presenting the end-user with a choice of non-dominating solutions at the so-called “Pareto Front”. Multi-objective optimization may be used to produce test suites that aim to satisfy multiple goals, such as generating test suites that focus on verifying properties as well as covering all of the branches of a program [5].

Search-Based Optimization and the Test Oracle. One of the most difficult challenges in software testing is the development or synthesis of the test oracle—an automated judgment of the behavior of the software [6]. Search techniques have the potential to be used in automatic oracle generation, oracle debugging, and the generation of tests engineered to surface faults tuned to specific oracles.

SBST for Web and Mobile Software. With the rapid rise of mobile and web-based software, the need has also emerged for effective testing of those systems. Search-based techniques have the potential to make a large impact in these areas, and have been used to—for example—provide security testing of web applications [7].

Human Aspects and Integration into Real Test Environments. Search-based techniques present the possibility to take into account domain knowledge or optimize tests for human usage (for example, incorporating a language model to produce test strings that aid comprehension [8]).

Enriching SBST with Machine Learning. Machine learning techniques have proven their worth across many aspects of software development. The use of machine learning to enrich heuristic optimization algorithms—and the use of search-based techniques to enhance learning algorithms—may be of incredible benefit to the SBST community [9].

Application of SBST in Industrial Practice and the Classroom. We have begun to see the adoption of SBST techniques in industrial settings. We would like to explore where SBST can and should be making an impact. Similarly, we would

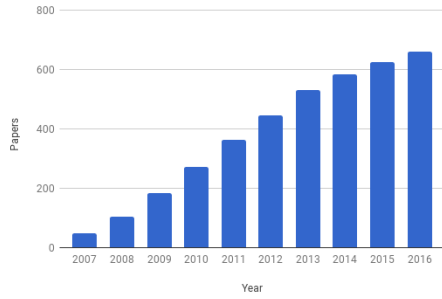


Fig. 1. Total number of publications in SBST since 2007.

like to explore the practicality of teaching SBST as part of the software engineering or computer science curriculum.

Sinergies of SBST and other SE areas. SBST is also ripe for combination with other areas of software engineering, e.g., requirements optimization and project planning. Possibilities exist to optimize the selection of requirements based not only on traditional aspects of SBSE for requirements (customer satisfaction, cost, etc.), but also on the implications for regression testing (code coverage, test execution time, and test effectiveness).

A. Relevance to Software Engineering

SBST has been applied to a wide variety of testing goals including structural [10], functional [11], non-functional [12] and state-based properties [13]. Many approaches to testing and a wide diverse range of development domains have been addressed, including exceptions [14], interactions [15], mutation [16], regression [17], stress [18] and web applications [7]. In SBST, the primary concern is to define a fitness function (or set of fitness functions) that capture the test objectives. The fitness function is used to guide a search-based optimization algorithm, which searches the space of test inputs to find those that meet the test objectives. Because any test objective can, in principle, be re-cast as a fitness function, the approach is widely applicable—as demonstrated by the prior list of testing applications. It is therefore highly relevant to Software Engineering. This relevance is further testified by the increasing cumulative number of publications in the area since 2007, as Figure 1 shows, providing evidence that SBST is a growing area [19].

B. Relevance To ICSE

The SBST workshop compliments ICSE well. The success of the previous five editions of SBST which were co-located with ICSE reassures us that the ICSE community is highly interested in computational search, and its applications in testing, verification, and a number of other Software Engineering tasks, and that the key to strengthening and expanding this exciting research area is to continue to hold our workshop alongside the ICSE conference. For example, SBST was the 3rd largest both in the number of submissions and registered participants among all workshops held at ICSE in 2016 and following the

recent media impact of a SBST tool (Sapienz), we expect a growing interest amongst ICSE participants in attending our workshop. By continuing to hold SBST with ICSE, we can reach out to other areas of software engineering expertise and produce fruitful collaboration.

C. Balance and Synergy Across ICSE Events

SBST complements workshops regularly appearing at ICSE, including the Automated Software Test (AST) workshop. We believe this is for two reasons:

1) SBST is More Than Just Automation. One of the benefits of the SBST approach is the ability to include a human-in-the-loop and their domain expertise. This has been exploited in search-based test data generation, where manually-produced test cases have been used to “seed” the search. Other techniques have used resources produced from man-made artifacts, including natural language models [8]. Search-based approaches allow for humans to supply judgements and act as a fitness function in their own right.

2) Search-Based Optimization Techniques are Specialized. Optimization is a research field in itself, and the application of techniques from this domain requires specific attention. The incorporation of an optimization technique involves thinking about the problem representation and properly tuning the search operators (i.e., crossover and mutation) to ensure proper solution convergence. Thus, the specifics of applying search-based optimization to testing are unlike the issues encountered in other areas of automated software engineering. Therefore, we believe a dedicated workshop addressing these matters is of importance and interest to ICSE participants, and as such, SBST is a useful addition to the ICSE workshops.

III. FORMAT AND REQUIRED SERVICES

A. Workshop Format

Some of the major goals of this workshop are to stimulate discussion, seed the generation of ideas for future research in SBST, and to encourage potential working relationships between participants. The starting point for discussions will be the following components:

Keynotes. We have shortlisted Gordon Fraser (affiliation: University of Passau, Germany) (suggested topic: future of search-based unit test generation), Shin Yoo (KAIST, South Korea) (challenges and opportunities for search-based software testing in the rise of ML and AI), Robert Feldt (Chalmers University of Technology, Sweden) (search-based software testing in industry) and Shiva Nejati (University of Luxembourg, Luxembourg) (search-based software testing for autonomous driving functions) as candidate keynote speakers.

Paper Sessions. Each paper will be given a 30 minute slot: 20 minutes will be devoted to the actual presentation. The final 10 minutes will be allotted for questions and discussion. We will nominate a “discussant” for each paper who will prepare questions in advance and be responsible for generating discussion points. To facilitate this, papers will be distributed in advance of the workshop and participants will be encouraged to read them in advance.

Tool Competition. The SBST Tool Competition has been running since 2012 and has consistently been well received by the workshop attendees. Participants apply their test generation approaches to a set of proposed benchmarks and submit a four-page report detailing their approach and results. The 7th edition of the competition will be organised by **Fitsum Kifetew** (Fondazione Bruno Kessler, Italy), **Xavier Devroey** (Delft University of Technology, Netherlands), and **Urko Rueda** (Universidad Politécnica de Valencia, Spain). We believe this competition will continue to attract students and researchers whose focus is to build industrial SBST tools.

Tutorial. The tutorial at SBST has grown in popularity in the recent editions of the workshop. Following Gordon Fraser (2016), Lionel Briand (2017) and Andrea Arcuri (2018), we will try to get someone from the Facebook Sapienz team to give this tutorial.

Discussion Session: We plan to hold a discussion session, where participants of the workshop can present their positions and ask questions on the topic of SBST at an open forum. Each participant will have up to three minutes to state their case and present questions to all the workshop participants. Based on the expertise of the registered participants, we will propose a set of topics for discussion and allow participants to break into groups to discuss and report on ideas/conclusions.

B. Intended Length

We propose to hold the workshop over two days. Our preference is to hold the workshop before the main conference on May 25-26, as we did in previous editions.

The proposed length of the workshop is in line with our expectation of accepting approximately seven full papers, three short/position papers and three competition reports. A tentative program is therefore as follows:

Day 1:	
8:45 – 9:00am	Introduction
9:00 – 10:30am	Keynote:
10:30 – 11:00am	Break
11:00 – 12:30pm	Paper Session 1 (4 papers)
12:30 – 2:00pm	Lunch
2:00 – 3:30pm	Tutorial:
3:30 – 4:00pm	Break
4:00 – 5:30pm	Competition Session
Day 2:	
9:00 – 10:30am	Keynote:
10:30 – 11:00am	Break
11:00 – 12:30pm	Paper Session 2 (4 papers)
12:30 – 2:00pm	Lunch
2:00 – 3:30pm	Paper Session 3 (4 papers)
3:30 – 4:00pm	Break
4:00 – 5:30pm	Discussion Session
5:30pm	Close

C. Logistics

We require a projector and projector screen for the presenters. Presenters will be able to use their own laptops, but will be able to use an organiser's, if necessary. A flipboard and/or whiteboard would be useful for recording discussion or making announcements.

IV. PARTICIPANT SOLICITATION

We intend to run an open workshop, in which papers will be solicited for presentation. We plan to make a call for full papers, short papers, and position papers and request at least one author of each accepted contribution to register and attend the workshop. Participation will not be limited to presenters—workshop attendance will be open to all. As discussed earlier, we also plan to hold a tool competition, that should appeal to industrial practitioners. We will especially encourage participation from students in all categories. While SBSE and SBST will likely be the dominant background of the participants, we will make an effort to attract researchers from other domains to foster wider discussions.

A. Expected Participant Numbers

We expect to maintain the high level of attendance of previous editions of the workshop. As a reference, the 2018 edition of workshop, held before the ICSE 2018 main conference in Gothenburg, Sweden, attracted approximately 30 participants.

V. PROCEEDINGS

A. Expected Contributions

We expect to accept 12–15 papers comprising of full papers (8 pages), short papers (4 pages), position papers (2 pages) and competition reports (4 pages). Accepted papers will appear in a pre-proceedings and will be proposed for publication in the ACM/IEEE digital libraries.

B. Review and Evaluation Process

We will follow a standard bidding process. Each paper will be reviewed by at least three PC members and evaluated according to the criteria of relevance, novelty, soundness, and ability to spark discussion during the workshop. Following reviews, there will be an online discussion, and finally, the organizers will make final decisions on paper acceptance, based on referee reviews and conclusions of the discussions. Depending on the level of submissions, we may also invite poster presentations from borderline papers that do not meet the acceptance criteria.

Competition reports will be evaluated by a dedicated committee of technical experts (Urko Rueda, Fitsum Kifetew and Annibale Panichella).

C. Program Committee

We plan to invite senior and young researchers to serve on the Program Committee. To guarantee the continued success of the SBST workshop and to keep growing the community, we aim to keep many of the people who have been served as PC members in previous editions of the workshop:

- Justyna Petke, *University College London, United Kingdom*
- Gregory Gay, *University of South Carolina, United States*
- Giuliano Antoniol, *École Polytechnique Montréal, Canada*
- Mark Harman, *Facebook London, United Kingdom*
- Tanja Vos, *Universidad Politécnica de Valencia, Spain*
- John Clark, *University of Sheffield, United Kingdom*
- Gordon Fraser, *University of Passau, Germany*
- Erik Fredericks, *Oakland University, United States*

- Phil McMinn, *University of Sheffield, United Kingdom*
- Paolo Tonella, *Università della Svizzera italiana, Switzerland*
- Annibale Panichella, *Delft University of Technology, Netherlands*
- Myra Cohen, *Iowa State University, United States*
- Nazareno Aguirre, *Universidad Nacional de Rio Cuarto, Argentina*
- Gabriela Ochoa, *University of Stirling, United Kingdom*
- Sebastiano Panichella, *University of Zurich, Switzerland*
- Claire Le Goues, *Carnegie Mellon University, United States*

D. Website

The website of the proposed workshop will be at:
<http://www.searchbasedsoftwaretesting.org/2019>

VI. WORKSHOP HISTORY

From 2008 to 2013, SBST was co-located with ICST (Intl. Conference on Software Testing, Verification and Validation). Since 2014, SBST has been co-located with ICSE

Ed.	Website
11 th	http://software.imdea.org/sbst18/
10 th	http://sbst2017.lafhis.dc.uba.ar/
9 th	https://cse.sc.edu/~ggay/sbst2016/
8 th	http://sbst2015.soccerlab.polymtl.ca/
7 th	http://www.searchbasedsoftwaretesting.org/2014/

VII. PROPOSERS' BIOS

Alessandra Gorla is an assistant researcher professor at the IMDEA Software Institute in Madrid, Spain. She received her Bachelor's and Master's degrees in computer science from the University of Milano-Bicocca in Italy. She completed her Ph.D. in informatics at the Università della Svizzera italiana in Lugano (USI), Switzerland in 2011. Before joining IMDEA Software Institute in December 2014, she has been a postdoctoral researcher in the software engineering group at Saarland University in Germany and a visiting researcher at Google. Alessandra is regularly serving as program committee member of top tier software engineering conferences. She has co-chaired the SBST 2018 workshop, the FSE 2016 Demonstrations Track, and the Artifact Evaluation at ISSTA 2016 and ESSoS 2016. Her research interests are in malware detection for mobile applications, automatic software repair, software testing and analysis.

José Miguel Rojas is an Assistant Professor (Lecturer) at the University of Leicester, United Kingdom. Previously, he was a Research Associate in Software Testing at The University of Sheffield, working mainly on search-based automated test generation and its application in real-world software development scenarios. José received his PhD in Software and Systems from the Technical University of Madrid (Spain, 2013). His research interests include empirical software engineering, automated software testing, and software engineering education. His work has been published in the top venues of logic programming (ICLP), software engineering (ICSE and ASE), software testing (ISSTA and ICST) and search-based software engineering (SSBSE and GECCO). He has co-chaired the MUTATION 2017 and MUTATION 2018 workshops and the SSBSE 2018 Challenge Track.

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SBST 2019

Draft Call for Submissions

About the Workshop

Search-Based Software Testing (SBST) is the application of optimizing search techniques (for example, Genetic Algorithms) to solve problems in software testing. SBST is used to generate test data, prioritize test cases, minimize test suites, optimize software test oracles, reduce human oracle cost, verify software models, test service-orientated architectures, construct test suites for interaction testing, and validate real-time properties (among others).

The objectives of this workshop are to bring together researchers and industrial practitioners both from SBST and the wider software engineering community to collaborate, to share experience, to provide directions for future research, and to encourage the use of search techniques in novel aspects of software testing in combination with other aspects of the software engineering lifecycle.

Keynote Speakers

- TBC
- TBC

Tutorial

- TBC

Workshop Organizers

- Alessandra Gorla, Program Co-Chair (IMDEA Software Institute, Madrid, Spain)
- José Miguel Rojas, Program Co-Chair (University of Leicester, United Kingdom)
- Fitsum Meshesha Kifetew, Competition Chair (Fondazione Bruno Kessler, Italy)

Important Dates

- Paper Submission Deadline: February 1, 2019
- Competition Report Deadline: February 15, 2019
- Author Notification: March 1, 2019
- Camera-Ready: March 15, 2019
- Dates of Workshop: May 25-26, 2019 (TBC)

Call for Papers

Researchers and practitioners are invited to submit:

- **Full papers** (maximum of 8 pages, including references) Original research in SBST, either empirical, theoretical, or showing practical experience of using SBST techniques and/or SBST tools.
- **Short papers** (maximum of 4 pages, including references) Work that describes novel techniques, ideas and positions that have yet to be fully developed; or are

a discussion of the importance of a recently published SBST result by another author in setting a direction for the SBST community, and/or the potential applicability (or not) of the result in an industrial context.

- **Position papers** (maximum of 2 pages, including references) that analyze trends in SBST and raise issues of importance. Position papers are intended to seed discussion and debate at the workshop, and thus will be reviewed with respect to relevance and their ability to spark discussions.
- **Tool Competition entries** (maximum of 4 pages, including references). We invite researchers, students, and tool developers to design innovative new approaches to software test generation.

In all cases, papers should address a problem in the software testing/verification/validation domain or combine elements of those domains with other concerns in the software engineering lifecycle. Examples of problems in the software testing/verification/validation domain include (but are not limited to) generating testing data, prioritizing test cases, constructing test oracles, minimizing test suites, verifying software models, testing service-orientated architectures, constructing test suites for interaction testing, and validating real-time properties.

The solution should apply a metaheuristic search strategy such as (but not limited to) random search, local search (e.g. hill climbing, simulated annealing, and tabu search), evolutionary algorithms (e.g. genetic algorithms, evolution strategies, and genetic programming), ant colony optimization, and particle swarm optimization.

Submission Format All submissions must conform to the ICSE 2019 formatting and submission instructions (<https://2019.icse-conferences.org/track/icse-2019-Technical-Papers#Call-for-Papers>). All submissions must be anonymized, in PDF format and should be performed electronically through EasyChair.

Workshop: <http://www.searchbasedsoftwaretesting.org/2019>

EasyChair: <https://easychair.org/conferences/?conf=sbst2019>

Tool Competition: <http://sbstcontest.dsic.upv.es>

Twitter: <https://twitter.com/sbstworkshop>