

2nd International KLEE Workshop on Symbolic Execution

Workshop Introduction

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Imperial College London





1st International KLEE Workshop on Symbolic Execution

19-20 April, 2018 • London, United Kingdom

Tweets by [@kleesymex](#)



kleesymex [@kleesymex](#)

Save the date! 1st International KLEE



1st International KLEE Workshop

- 19-20 April 2018 at Imperial College London
- 82 participants from academia, industry and government
 - Had to close registration early due to capacity constraints
- Dozen different countries across three continents
- Sponsored by EPSRC, Baidu, Bloomberg, Fujitsu, Huawei, Imperial College
- Three academic keynotes (Khurshid, Orso, Roychoudhury)
- Two industry keynotes (Ghosh – Fujitsu, Li – Baidu)
- 17 regular talks and 5 posters
- Lunches, coffee breaks, and pub
- Fantastic feedback post-workshop

2nd International KLEE Workshop

- ~~• 14-15 September 2020, London, UK~~
- ~~• 22-23 April 2021, London UK~~



Image by Karen Arnold (public domain)

2nd International KLEE Workshop

- ~~• 14-15 September 2020, London, UK~~
- ~~• 22-23 April 2021, London UK~~
- 10-11 June 2021, Online

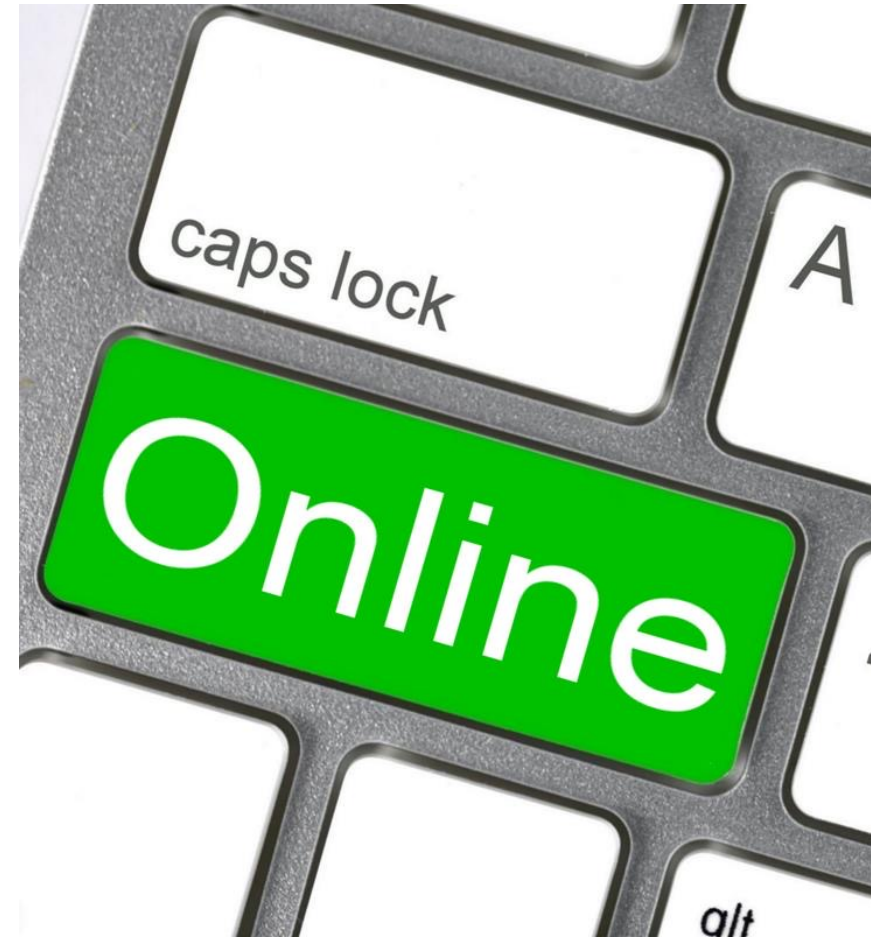


Image by Nick Youngson, Alpha Stock Images (CC-BY-SA 3.0)

Symbolic Execution: A Bit of History: 1975-76

Programming
Languages

B. Wegbreit
Editor

Symbolic Execution and Program Testing

James C. King
IBM Thomas J. Watson Research Center

Symbolic execution of PL/I programs

A PROGRAM TESTING SYSTEM*

Lori A. Clarke
Computer and Information Science Dept.
University of Massachusetts
Amherst, Massachusetts 01002

Symbolic execution of Fortran programs

SELECT--A FORMAL SYSTEM FOR TESTING AND DEBUGGING PROGRAMS BY SYMBOLIC EXECUTION*

Robert S. Boyer
Bernard Elspas
Karl N. Levitt
Computer Science Group
Stanford Research Institute
Menlo Park, California 94025

Symbolic execution of LISP programs



1975-76

A Bit of History

**The challenges—and great promise—
of modern symbolic execution techniques,
and the tools to help implement them.**

BY CRISTIAN CADAR AND KOUSHIK SEN

Symbolic Execution for Software Testing: ~~Three~~ Decades Later

4+

COMMUNICATIONS OF THE ACM | FEBRUARY 2013 | VOL. 56 | NO. 2



CREST

BINSEC

SymCC

PyExZ3

SymDroid

PathGrind

Miasm

CUTE

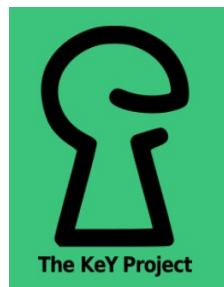
SAGE

Otter

TRILON

jCUTE

Jalangi2



Symbolic PathFinder

Savior

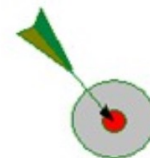
SymJS

Manticore

angr



BinSE



DART

Kite



Pex

Rubyx

LDSE

JDart



S²E

CATG

CiVL



Mayhem

KLOVER



Webpage: <https://klee.github.io/>

Code: <https://github.com/klee/>

Web version: <http://klee.doc.ic.ac.uk/>

Active project

12+ years since open-sourced

8 releases

2300+ commits

400+ resolved issues

Active community

100+ contributors to codebase incl. subprojects

400+ subscribers to mailing list

490+ public forks of KLEE repository

1700+ stars on GitHub



Academic Impact & Interest

- SIGOPS Hall of Fame Award (KLEE paper)
- CCS Test of Time Award (EXE paper)
- 3200+ citations to original KLEE paper
- 200+ publications and systems building upon KLEE
 - <https://klee.github.io/publications/>
 - From many different research communities: testing, verification, systems, software engineering, programming languages, security, etc.



Industry Impact & Interest

- Companies sponsoring 1st & 2nd KLEE workshops: **Baidu, Bloomberg, Google, Huawei, Fujitsu, Samsung**
- Two keynotes in the first KLEE Workshop:
 - Fujitsu: **Utilization and Evolution of KLEE-based Technologies for Embedded Software Testing at Fujitsu**
 - Baidu: **ConcFuzzer: A Sanitizer Guided Hybrid Fuzzing Framework Leveraging Greybox Fuzzing and Concolic Execution**
- Many different companies reporting on using/experimenting with KLEE:
 - **Baidu**: [KLEE 2018], [IEEE S&P 2020]
 - **Fujitsu**: [PPoPP 2012], [CAV 2013], [ICST 2015], [IEEE Software 2017], [KLEE 2018]
 - **Google**: [2x KLEE 2021]
 - **Hitachi**: [CPSNA 2014], [ISPA 2015], [EUC 2016], [KLEE 2021]
 - **Intel**: [WOOT 2015]
 - **NASA Ames**: [NFM 2014]
 - **Samsung**: [2x KLEE 2018]
 - **Trail of Bits**: <https://blog.trailofbits.com/>
 - **etc.**
- Many industry participants at KLEE workshops!

KLEE and SymEx: *Beyond* Bug Finding

- Bug finding is *extremely* important
- But symbolic execution is applicable to *many other* problems!
 - Program repair
 - Verification
 - Refactoring
 - Education
 - Equivalence checking
 - Test case generation and augmentation
 - Debugging and fault localization
 - Model learning
 - Document repair
 - Reverse engineering
 - Side-channel analysis
 - Test-case reduction
 - Liveness analysis
 - Binary lifting and recompilation
 - Detecting cheating in online games

etc. etc.



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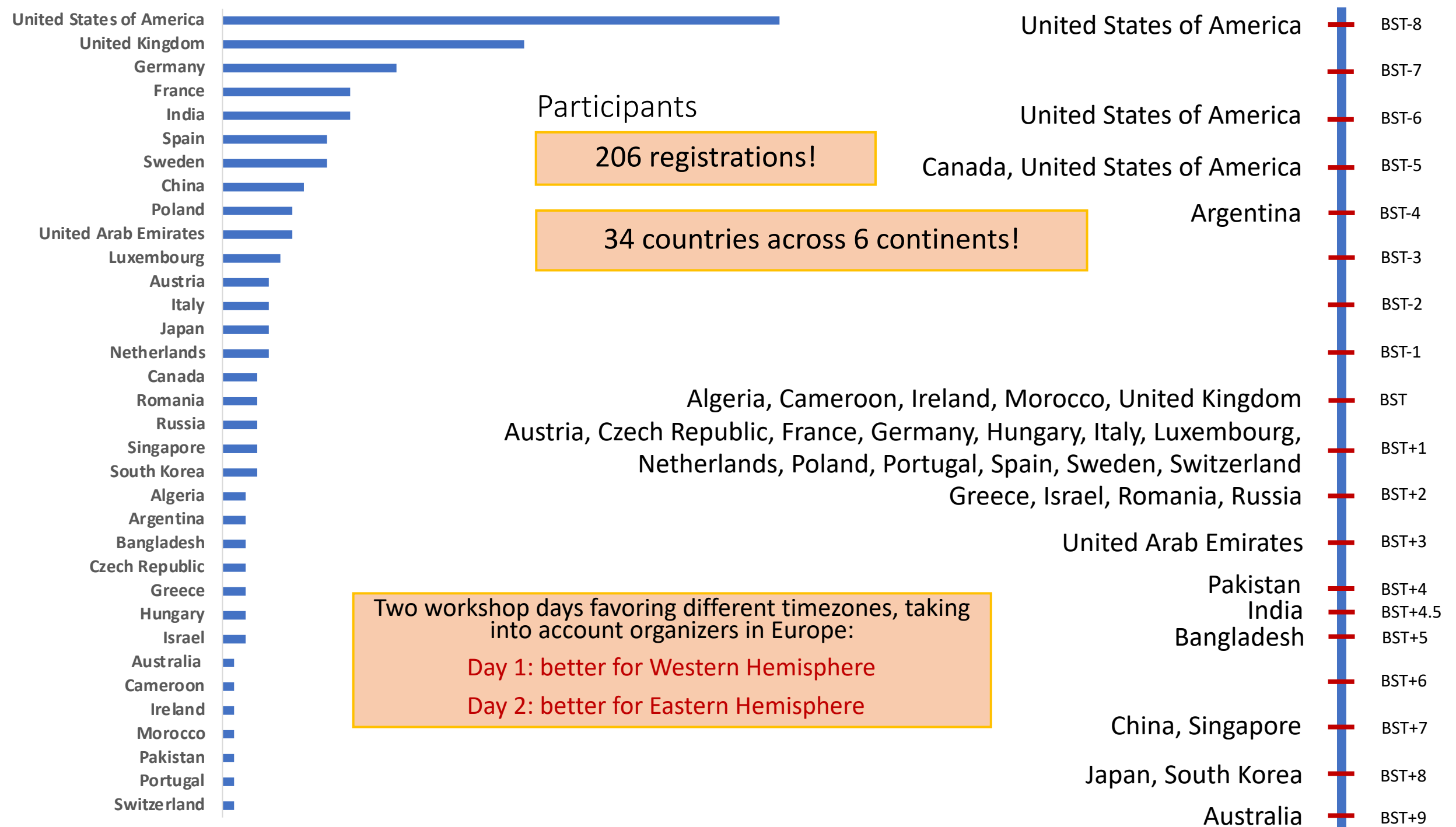
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Tweets by [@kleesymex](#)



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Affiliations

- Good mix of academia and industry
 - Around 60% academia and 40% industry
- Good mix of career stages
 - E.g., academic researchers pre- and post-PhD in similar proportion

verification Cybersecurity **education** computational
 Binary languages Realtime **Security**
 Validation Tooling **systems** Distributed
 broadly Adversarial Architecture iot Compilers side Design
repair tools Hypervisor static **robotics** learning
 Collectors SE Forensic Dynamic testability research
 SMT-solver IC Virtual Automotive fault verify Cyber detection
 program unit Quality bugs vulnerabilities Reliability formal analysis
 Machines **Software** Automatic Usable rewriting
 Logic **KLEE** Using Adaptive
 utils/coreutils methods symbolic programming S/W assessments
 channel Fuzzing Automated compute Garbage PDR drones
 method Code sweng **Deobfuscation** Computer
 offensive machine Science System **testing** IDEs apps genomics
 focus localization validation/verification Reverse
 Vulnerability interpretation Automata abstract
 Hybrid mobile **databases**

Participants interests

Program

- Keynote from Chao Wang, USC
- 24 regular presentations, grouped into 7 sessions:
 - 1) Memory Representation and Constraint Solving
 - 2) Testing Evolving Software and Fault Injection
 - 3) New Applications
 - 4) Mutation Testing and Fault Localization
 - 5) Scalability and Side Channels
 - 6) Model Learning and Education
 - 7) Extending Applicability
- A big thank you to all contributors and participants!

Organization Team

- Frank Busse (co-chair)
- Martin Nowack (co-chair)
- Timotej Kapus
- Hassan Patel
- Jamie Perrins



Gold sponsors

Bloomberg[®]

SAMSUNG

Silver sponsor

Google

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**Imperial College
London**



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Symbolic Execution

Thank You
To Our Sponsors

<https://srg.doc.ic.ac.uk/kee21/>
[@kleesymex](#)

Session Chairs

- Tomasz Kuchta (Session 1)
- Alastair Reid (Session 2)
- Alex Orso (Session 3)
- Sébastien Bardin (Session 4)
- Daniel Schemmel (Session 5)
- Julien Vanegue (Session 6)
- Martin Nowack (Session 7)

KLEE Contributors

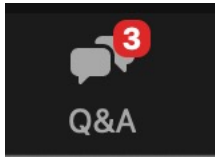
- Martin Nowack for co-maintaining KLEE for the last many years
- Prior co-maintainers Daniel Liew, Andrea Mattavelli and Daniel Dunbar
- Daniel Dunbar for starting the project back in 2007!
- Other major contributors particularly Julian Büning, Frank Busse, Jiri Slaby, Peter Collingbourne, Timotej Kapus, Gleb Popov, Hristina Palikareva
- Frank Busse for maintaining the list of publications building up on KLEE (now at 220+)
- The entire awesome KLEE community

Workshop Logistics

- Regular talks take ~12' followed by ~3' of Q&A
 - Session chairs will ensure that talks don't overrun
 - Both live and pre-recorded, depending on speaker preferences
- Sessions end with a discussion with the speakers and session chair
 - Audience can ask additional questions about specific talks or the session topic
- Recording policy: the workshop is recorded BUT:
 - The Q&A and discussion sessions will NOT be made available to encourage participation
 - Individual talks will be made available with workshop permission via a YouTube KLEE channel

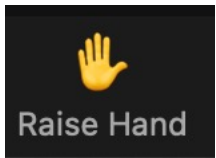
Workshop Logistics

Please use Zoom's Q&A feature to:



- 1) Ask questions
- 2) Vote on interesting questions

After each session, any unanswered questions are dismissed



You can also raise your hand to ask questions with voice:

- But with a large audience size, it makes sense to prioritize written questions



You can use Discord for more questions and to chat about other topics

Two Final Requests

- Contribute your techniques/extensions (or parts of) to the KLEE mainline
 - An achievement in itself, as the barrier for successful integration is high
 - Your technique won't be forgotten and will be useful to others
 - New techniques could compare with your technique too
- Ask lots of questions during the workshop!
 - That's one of the main reasons for having the workshop in the first place!



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