Runtime verification

(aka Dynamic Analysis)

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About the author

- Teamlead @ Samsung Moscow
- Accidentally became a compiler writer
 15 years ago
 - In-house, GCC, LLVM, neurocompilers (also some HPC and gamedev)
- Passionate about verification in general and dynamic/static analyses in particular
 - GitHub <u>yugr</u>
 - Habr the real yugr



Disclaimer

- A big picture overview without delving into details of particular checkers or technologies
- Engineering focus
- C/C++-focused (although ideas are generally applicable)

This presentation is available at

- (slides) https://github.com/yugr/Lalambda/blob/master/21/talk.md
- (practice)
 https://github.com/yugr/Lalambda/blob/master/21/practice.md

Overview

- Runtime verification aka dynamic analysis
- Instrumentation of programs to verify behavioral invariants at runtime
 - safety, performance, etc.
 - verifying code is called a "monitor"
- (Much) more widely used in industry than static tools:
 - no false positives
 - no scalability problems
 - reprocases easily available

Disadvantages

- Limited coverage
- Solved via
 - fuzzing
 - rule/grammar-based input generators
 - A/B testing (in production environments like Google services)

Example analyses

- Virtual memory :)
- Sanity checks in code
 - e.g. C/C++ assertions in programs
 - o e.g. Glibc malloc or libstdc++ iterator internal checks
- Valgrind
- Sanitizers (Asan, UBsan, Msan, Tsan, etc.)
- "Business rules" (GDPR, data minimization, etc.)

Community

- Academia (<u>Runtime Verification conference</u>)
 - grew out of model checking in 2000-s (<u>Runtime Verification 17 Years</u>
 <u>Later</u>)
 - verify complex modal logic formulas on program traces
 - usually applied to interesting but niche projects
- Industry (hackers and corporations)
 - automatically detect bugs at large scale (without manual work by user)
 - much older (malloc debuggers existed at least since 80-s)
 - typically much more influential

Dynamic analysis algorithm

```
errors = {}
program_with_monitor = instrument(program, spec)
while test_corpus not empty:
   test_input = test_corpus.pop()
   errors, coverage, ... += program_with_monitor(test_input)
   update test_corpus
```

Dynamic analysis algorithm

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```

Ontology of dynamic analysis project

Runtime analysis tool ("checker") contains of three main "parts":

- spec: an invariant that we want to check
- instrumentation (aka monitor): a way to verify that invariant is preserved during execution
- test corpus: input data which we run the checker through

New successful checkers are created by innovating in any of the three components.

Creating new checkers: spec

The "spec" part:

- come up with a new interesting class of bugs and propose method to autodetect them
- most interesting classes already handled:(
- e.g. <u>Sortchecker</u> was the first tool to check <u>qsort axioms</u>

Spec taxonomy (1)

- Memory errors (<u>Asan/Msan</u>, <u>Valgrind</u>):
 - liveness errors: accessing after end-of-life (use-after-free, useafter-return, iterator invalidation)
 - buffer overflow: heap, global, stack
 - uninitialized memory
 - memory leaks
- Typing errors (in non-type safe languages like C)
 - aliasing violations (<u>TypeSanitizer</u>)
 - mismatched types (<u>libcrunch</u>)

Spec taxonomy (2)

- Parallel programming errors (Tsan):
 - deadlocks and data races
- Language-specific errors:
 - integer overflows (<u>UBsan</u>)
 - static init order fiasco (Asan)

Spec taxonomy (3)

- Invalid usage of APIs:
 - o not checking return codes of syscalls or standard APIs
 - mismatched memory allocation API (calling free on new -ed pointer)
 - invalid comparators

Spec taxonomy (4)

- Violation of "business rules":
 - very application specific
 - specifications are extracted from domain experts, architects, QA, etc.
 - Runtime Verification, from Theory to Practice and Back and Industrial Experiences with Runtime Verification

Creating new checkers: instrumentation

The "instrumentation" part:

- for an existing spec, develop new ways to detect more errors more efficiently
- often determine whether checker will be used
- e.g. there were many buffer overflow checkers before AddressSanitizer but too slow or with limited coverage

Instrumentation taxonomy

- Aka <u>aspect-oriented programming</u> (AOP)
- Runtime verification is trivial in languages like Python or Java
 - full access to AST at runtime
 - many AOP frameworks
- Instrumentations of native code are categorized by stage in compilation pipeline and mechanism used for instrumentation
 - compromise between simplicity of implementation/integration and desired level of detail

Instrumentation taxonomy: preprocess-time

- Code can be instrumented by forced inclusion of debug header
 - e.g. via -include mychecker.h
 - header would contain something like#define malloc my_safe_malloc
- Examples:
 - o dmalloc
 - Glibc FORTIFY SOURCE

Instrumentation taxonomy: compile-time

- Compile-time instrumentation:
 - o source-to-source (e.g. <u>libcrunch</u>)
 - traditionally done via <u>CIL</u> but it's C only :(
 - Clang LibTooling supports C++ but is complicated to use due to baroque AST
 - codegen-based (e.g. <u>Asan</u> or <u>DirtyPad</u>)
 - asm-based (e.g. <u>AFL</u> or <u>DirtyFrame</u>)

Instrumentation taxonomy: link-time

Link-time instrumentation:

- replacing normal code with "checking" implementations at link time
- e.g. via -W1, --defsym, malloc=my_safe_malloc or -W1, --wrap=malloc
- e.g. <u>malloc dbg</u> replaces normal <u>malloc</u> if user links against debug version of Microsoft runtime

Instrumentation taxonomy: run-time

Run-time instrumentation types:

- LD_PRELOAD -based (e.g. <u>ElectricFence</u>, <u>sortchecker</u>, <u>failing-malloc</u>)
 - LD_PRELOAD is a canonical way to implement AOP on Linux
- syscall instrumentation (e.g. <u>SystemTap</u>)
- dynamic binary instrumentation (aka DBI, e.g. <u>Valgrind</u>, <u>DynamoRIO</u> or <u>Intel Pin</u>)

Creating new checkers: test corpus

- Project testsuites provide insufficient code coverage
- Need to extend test corpus by generating new tests:
 - via fuzzing:
 - random (e.g. <u>Radamsa</u>, <u>zzuf</u>)
 - feedback-driven (e.g. <u>AFL</u>, <u>libFuzzer</u>)
 - concolic (e.g. <u>Microsoft SAGE</u>, <u>Mayhem</u>, <u>KLEE</u>)
 - by developing generator for sufficiently important class of data
 - e.g. <u>Defensics</u> supports grammar-based test generation for <u>250+</u>
 <u>protocols</u>
 - e.g. Csmith generates random C++ code for compiler testing

How to test a checker

- Once checker is ready you'll want to test it on as much code as you can
- Try to apply it to important OSS projects
 - o archivers, media processing libraries, browsers, etc.
 - to find interesting package faster:
 - package popularity rating
 - <u>Debian codesearch</u> (supports both web and cmdline interfaces)

How to test an LD_PRELOAD- or DBI-based checker

- Checkers which do not require program recompilation are easier to test:
 - Run all apps in /bin and /usr/bin
 - without params, with --help , with --version
 - automatic but coverage is low (tests initialization code, at best)
 - boot complete Linux distro with your checker preloaded
 - for example <u>valgrind-preload</u>
 - limited applicability
 - need to perform manual actions to explore system behavior

How to test an arbitrary checker

- Run package unittests (if available)
 - good coverage but not scalable (5-30 minutes per package)
 - tiresome and demotivating :(
- System testsuites
 - run system benchmarks (e.g. <u>Phoronix suite</u> or <u>browser</u>
 <u>testsuites</u>)
- Instrument complete Linux distro (e.g. sanitize Tizen)
 - extremely hard...

How to test a checker: comparison

Test	Automatic	Coverage	All checkers
Running apps with standard params	Y	Low	Only LD_PRELOAD/DBI
System testsuites	Y	Average	Y
Manual package testing	N	High	Υ
Distro boot	iff LD_PRELOAD/DBI	Average (need manual actions to increase)	Y

Using distro build systems

- Linux distros come with a vast number of packages
- Distro build systems can be reused
 - to apply checkers under the hood
 - and run package-specific unittests
- Debian build toolchain
 - Sadly only builds, not tests, but ...

debian_pkg_test

- With some hacking we can make Debian build system to run unittests for us!
- <u>debian pkg test</u> project
 - based on <u>pbuilder</u>
 - runs make check (or other standard test commands) once package build completes

Trends (1)

Increasing fuzzing speed and efficiency (coverage) by various means

- feedback-driven ("grey-box")
 - AFL and related tools (gofuzz, libfuzzer, etc.)
- symexec-driven ("white-box")
 - Billions and Billions of Constraints: Whitebox Fuzz Testing in Production
- various combinations thereof

Trends (2)

Increasing fuzzing adoption in community:

- integration of fuzzers into development lifecycles (kudos to @msh_smlv)
- inspire project owners to write fuzzing for their projects through initiatives like <u>OSS-fuzz</u>
- bug bounty programs e.g. Google Fuzzilli

Links

- Runtime Verification conference (Springer)
 - Too scientific
 - Most papers are on verifying temporal logic assertions at runtime
- More practical: vulnerability reports
 - CVE reports
 - DEFCON
 - Blackhat
 - Phrack

Advertisement

Samsung System-On-Chip team is hiring developers to develop state-of-the-art compilers in Moscow Research Center:

 NPU Compiler Developer for Exynos Al Accelerator (https://hh.ru/vacancy/42341825)

Also need GPU performance engineers, whatever that means (https://hh.ru/vacancy/44907512).

The End

Please share your ideas on runtime verification (new checkers, novel ways to test them, etc.):

- tetra2005 beim gmail punct com
- TG the real yugr
- GH <u>yugr</u>

Checker gotchas

- Instead of testing that bad objects are not accessed, make sure that such accesses cause havoc
 - Fill undef memory/regs with garbage (MSVS does this with mallocked memory)
 - Unmap page after buffer to force segfault (ElectricFence)
 - Fill gaps in stack frame with random values (DirtyFrame)
 - Fill struct pads with random values (DirtyPad)
 - Intro random delays in Pthread-based programs