

Software security, secure programming (and computer forensics)

Lecture 10: Dynamic Analysis and Fuzzing

Master M2 on Cybersecurity

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Program proof

Prove some logical assertion over the pgm variables at given control locations (e.g. , using weakest precondition computations)

A sound and complete technique, but a non decidable problem ...

- ▶ a semi-automated approach:
 - user inputs required to give loop invariants and prove logical implications
- ▶ tools can be used to assist the proof construction and/or to check the correctness of a manual proof ...

Which usage in vulnerability detection ?

- ▶ for small or “highly critical” pieces of code
- ▶ as a (long term effort) technique to **prove** the correctness/security of a whole software or device **Ex:**
 - ▶ the CompCert C compiler
 - ▶ XXX

Abstract Interpretation

A static analysis technique

- ▶ allow to (automatically) reason about a whole program without executing it ...
- ▶ but at the price of **approximations** due to undecidability problems:
 - ▶ over-approximations \rightsquigarrow false positives
 - ▶ under-approximations \rightsquigarrow false negatives
- ▶ example: **value-set analysis (VSA)**
abstract representation = trade-off between accuracy and efficiency (e.g., intervals vs polyhedra vs ...)
- ▶ can be leveraged with use-provided assertions ...
(to deal with library calls, “complex” code patterns, etc.)

Long (success) story in program verification \Rightarrow numerous tools available!

But:

- ▶ not so effective on binary code, simple memory model
- ▶ not go “beyond the bug” (\neq exploitability analysis)
- ▶ may provide **too many** false positives ?

What help for “security analysis” ?

“security analysis” = vulnerability detection

A pragmatic approach:

1. annotate the code with “vulnerability checks” (e.g., `frama-c -rte`)
i.e., assertions to detect integer overflows, invalid memory accesses (arrays, pointers), etc
2. run a VSA
→ reveals a lot of **hot spots** (= unchecked assertions)
3. add user-defined assertions when possible ...
e.g., function pre/post conditions, loop invariants, extra information ...
→ consider **proving** (some of) these assertions ?
4. run the VSA again ...

⇒ a set of **potential vulnerabilities** remains, to be discharged by **other means**, possibly on a **program slice**
(false positive ? real bug but harmless w.r.t security ? real vulnerability ?)

Rk: some static analysis tools also provide **bug finding** facilities
(i.e., no false positives, ... but false negatives instead)

(Dynamic) Symbolic Execution (DSE)

Run a subset of finite program executions ...

- ▶ a test generation technique
- ▶ can be coverage-oriented or goal-oriented

Principle:

Associate a **path predicate** φ_σ to each path σ of the CFG:

$$(\exists \text{ a variable valuation } v \text{ s.t. } v \models \varphi_\sigma) \Leftrightarrow (v \text{ covers } \sigma)$$

(φ_σ is the conjunction of all boolean conditions associated to σ in the CFG)

- ▶ solving φ_σ indicates if σ is feasible
- ▶ iteration over a finite subset of the CFG paths ...

In practice:

- ▶ express φ_σ in a decidable logic fragment (e.g., SMT).
- ▶ may need to concretize some symbolic variables (loosing completeness of the path predicate)

DSE for vulnerability analysis

- ▶ an effective and flexible test generation & execution technique
 - ▶ can be used on “arbitrary” code
dynamic allocation, complex math. functions, binary code
 - ▶ trade-off between correctness, completeness and efficiency
(ratio between symbolic and concrete values)
 - ▶ can be used in a coverage-oriented (bug finding) or goal-oriented (vulnerability confirmation) way
Ex: out-of-bound array access, arithmetic overflow, etc.

⇒ widely used in vuln. detection and exploitability analysis)

- ▶ numerous existing tools ...
- ▶ however, not all problems solved (yet ?), e.g.:
 - ▶ “path explosion” problem on large codes
 - ▶ can be rather slow (compared with *fuzzing*)

Back to (pure) Dynamic Analysis

*run an **instrumented version** of the target program to collect **runtime information** on the **program behavior***

Some very appealing features

- ▶ can be used on (almost) every kind of applications¹: binary code, complex functions, large applications, virtual execution environment, etc.
- ▶ several execution-level applications:
 - ▶ detect **assertion violations**
 - ▶ profiling
 - ▶ data-flow analysis (e.g., **taint analysis**)
 - ▶ source-level engineering

⇒ rather well adapted for security analysis / vulnerability detection

Main requirements

- ▶ code instrumentation facilities + instrumented code execution
- ▶ find **good program inputs** !
 - ⇒ makes sense within **testing or fuzzing campaigns**

¹as long as instrumentation is feasible, see later

More details on instrumentation techniques and tools

see Nick Sumner's slides . . .

Fuzzing, or how to cheaply produce "interesting" program inputs ?

A major concern for dynamic analysis:

*feed the target program with **good** input values . . .*

Fuzzing = combination of several possible strategies

- ▶ human expertise, (non) typical use-cases
- ▶ dynamic symbolic execution
- ▶ other code or input space coverage techniques
- ▶ (pseudo)-random values, (pseudo)-random mutations of given inputs
- ▶ etc.

Key elements

- ▶ input generation should be fast enough to maximize the # of executions
- ▶ need a **test oracle**
 - from **crash detection** to complex **dynamic property checkers**

⇒ one of the most effective vulnerability detection technique to date . . . !

A trendy and powerful fuzzer: AFL

American Fuzzy Loop

A general-purpose fuzzing tool
(not specific to a set of applications, protocols, etc.)

- ▶ C, C++, Objective C
- ▶ Python, Go, RUST, OCaml, ...
- ▶ (any) binary code (with QEMU)

governing principles

- ▶ speed
- ▶ reliability
- ▶ ease-of-use
- ▶ availability and code sharing ...

`lcamtuf.coredump.cx/afl/`

Fuzzing algorithm

branch coverage-oriented mutation-based fuzzing

Repeat until a time budget is reached:

1. pick a input from a queue
2. mutate it
3. run it
4. if "coverage increases" put the new input in the queue

Detailed qlgo:

<https://www.comp.nus.edu.sg/~mboehme/paper/CCS16.pdf>

Code instrumentation

Lightweight instrumentation to capture:

- ▶ branch coverage
- ▶ coarse branch hits count

→ Use a 64Kb shared memory to record (src,dest) branch hits code injected at each branch point:

```
// identifies the current basic block
cur_location = <compile-time-random-value> ;
// mark (and count) a tuple hit
sh_mem[cur_location ^ prev_location]++ ;
// to preserve directionality
prev_location = cur_location >> 1;
```

trade-off in the size of this memory : #collision vs efficiency (L2 cache)

Detecting new behaviors:

- ▶ maintains a global map of tuple (= branch) seen so far
- ▶ only inputs creating new tuples are added to the input queue (others are discarded)

Rk: branches are considered outside their context

→ may ignore new paths ...

Some further heuristics

- ▶ Tuple hits counted using buckets
(1, 2, 3, 4-7, 8-15, ..., 128+)
inputs leading to a change of bucket are added to the input queue
- ▶ Strong time limits for each executed path
motivation: better to try more paths than slow paths ...
- ▶ Periodic queue minimization
→ -> select a small subset covering the same tuples mix between
 - ▶ execution latency + file size
 - ▶ ability to cover new tuplescan be used as well by other external tools ...
- ▶ Trimmig input files
→ reduce their size to speed-up fuzzing
e.g., remove the size of variable lengths blocks

⇒ favorite seed = fastest and smallest input excersizing a tuple

Mutation strategy

no relationships between mutations and program states

- ▶ deterministic (sequentially):
 - ▶ flip bits (<> lengths and stepovers)
 - ▶ add/subtract small integers
 - ▶ insert known interesting integers (0, 1, INT_MAX, etc.)
- ▶ non deterministic:
insertion, deletion, arithmetics, etc.

Dictionaries

used to retrieve/build syntax of verbose input language
(e.g., JavaScript, SQL, etc.)

Crash unicity

- ▶ faulty address is too coarse (e.g., crash in strcmp)
- ▶ call stack checksum is too slow

AFL

a crash is new if

- ▶ crash trace include a new tuple wrt existing crashes
- ▶ crash trace miss some tuple wrt existing crashes

Also provide some support for crash investigation . . .