Symbolic Execution

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ecoppa.github.io

Why Symbolic Execution?

Real-world applications of this methodology:

- (Software Testing) Bug detection
 e.g., inputs that crash an application
- (Security) Exploit and backdoor identification e.g., inputs to bypass authentication code

(Security) Malware analysis
 e.g., trigger malicious behaviors in evasive or dormant malware

What is Symbolic Execution?

Originally introduced by **James C. King** in a **1976** paper as a static analysis technique for *software testing*.

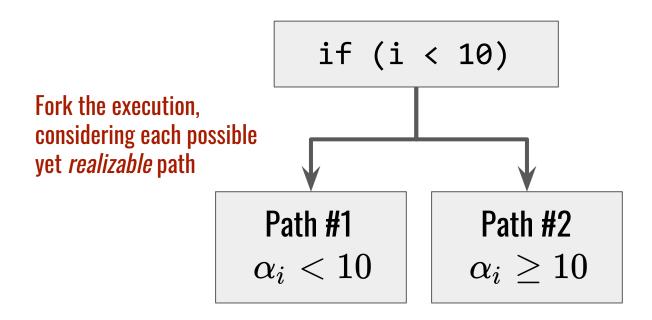
Key ideas:

- ullet Each *input* variable is associated to a *symbol*, e.g., int i $\mapsto \alpha_i$
- ullet Each symbol represents a set of input values, e.g., $lpha_i \in [0,2^{32}-1]$
- Program statements generate formulas over symbols, e.g.,

$$i * 2 + 5 \mapsto 2 \cdot \alpha_i + 5$$

What about conditional branches?

Symbolic Execution: conditional branch



From now on, we should consider these *path constraints*

Example: find input values that make assertion fail

```
1. void foobar(int a, int b) {
      int x = 1, y = 0;
3. if (a != 0) {
       y = 3 + x;
4.
5. if (b == 0)
         x = 2*(a+b);
6.
7.
8. assert(x-y != 0);
```

Symbolic Execution can find **all** the inputs leading to the failure.

Can you do the same?

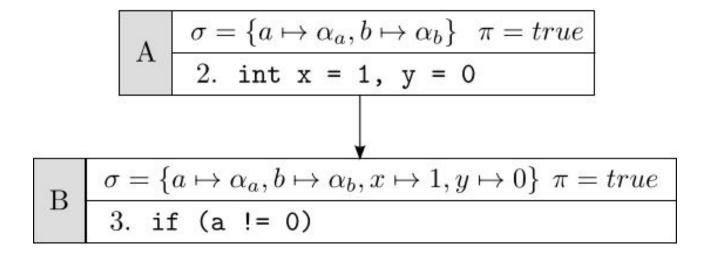
Symbolic Execution: execution state

Execution state (stmt, σ , π):

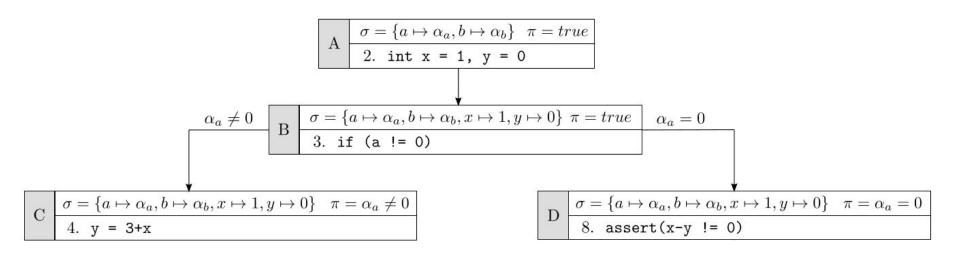
- stmt is the next statement to evaluate
- σ is the *symbolic store* that maps program variables to expressions over concrete values or symbols
- π denotes the path constraints, i.e., assumptions made at branches taken in the execution to reach stmt. Initially, $\pi = true$

In our example:

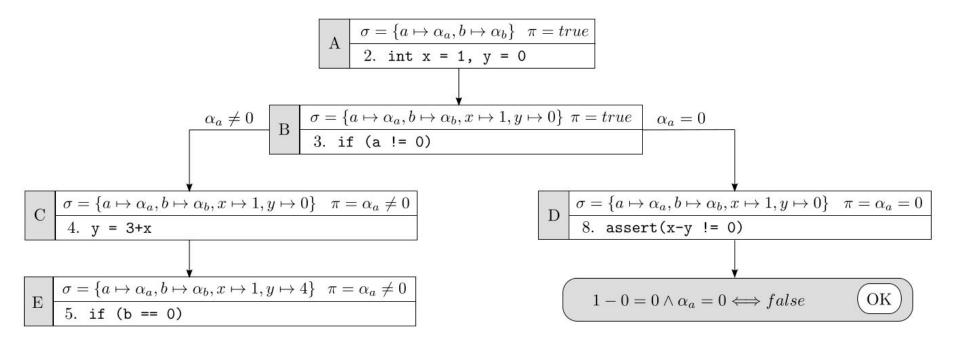
Example: symbolic exploration (1)



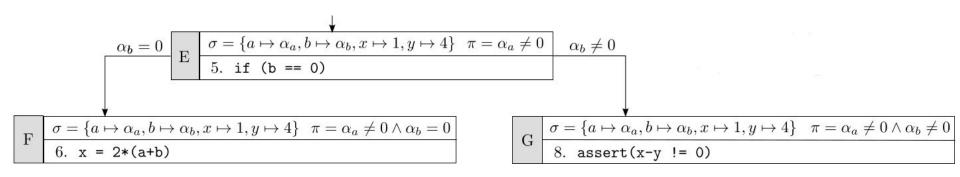
Example: symbolic exploration (2)



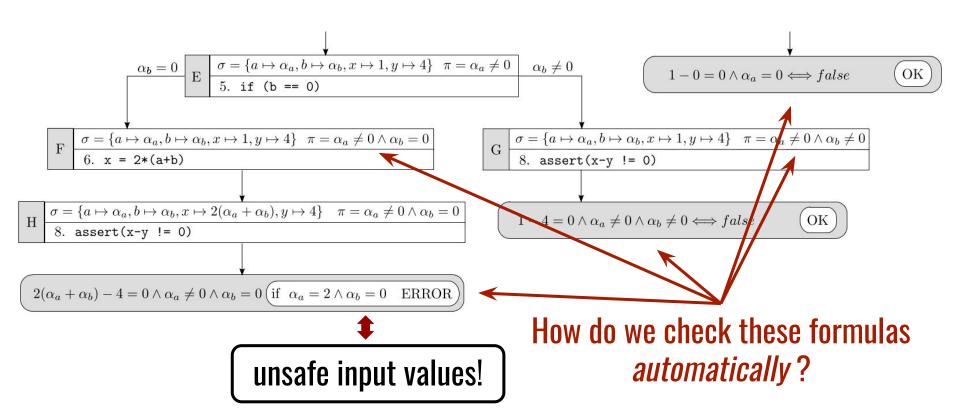
Example: symbolic exploration (3)



Example: symbolic exploration (4)



Example: symbolic exploration (4)



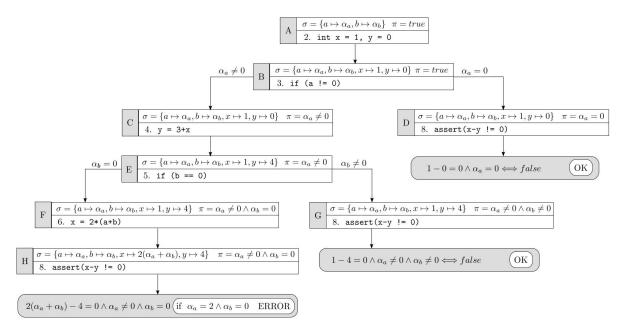
How to check a symbolic formula?

formula SMT solver **Quantifier-free SMT solver** Instance **Boolean Model** Instantiation Theory **SAT** solver module reasoner Model Conflict clause UNSAT (proof/core) Model (image credits)

SMT Solvers

SAT is everywhere!

Example: symbolic exploration (5)



We checked **all** possible paths.

Can we prove that no other crash may happen?

Symbolic Execution: soundness and completeness

Can we prove that no other crash may happen?

In theory, yes. In practice, no.

When analyzing programs with Symbolic Execution:

- Constraints may be hard to solve
- Too many paths may be generated
- Tons of details play a role during an execution

Symbolic Execution: is it actually useful?

A quote from "AEG: Automatic Exploit Generation" (T. Avgerinos et al.):

[...] KLEE is a state-of-the-art forward symbolic execution engine, but in practice is limited to small programs such as /bin/ls.

Pure static symbolic execution hardly scales in practice.

Symbolic Execution: a success story [SAGE NDSS08]



SAGE has had a remarkable impact at Microsoft.

Patrice Godefroid, Michael Y. Levin, David Molnar, Microsoft

Most *ACM Queue* readers might think of "program verification research" as mostly theoretical with little impact on the world at large. Think again. If you are reading these lines on a PC running some form of Windows (like 93-plus percent of PC users—that is, more than a billion people), then you have been affected by this line of work—without knowing it, which is precisely the way we want it to be.

Symbolic Execution: a success story (2)

IMPACT OF SAGE

Since 2007, SAGE has discovered many security-related bugs in many large Microsoft applications, including image processors, media players, file decoders, and document parsers. Notably, SAGE found roughly *one-third* of all the bugs discovered by file fuzzing during the development of Microsoft's Windows 7. Because SAGE is typically run last, those bugs were missed by everything else, including static program analysis and blackbox fuzzing.

Finding all these bugs has saved millions of dollars to Microsoft, as well as to the world in time and energy, by avoiding expensive security patches to more than 1 billion PCs. The software running on *your* PC has been affected by SAGE.

Since 2008, SAGE has been running 24/7 on an average of 100-plus machines/cores automatically fuzzing hundreds of applications in Microsoft security testing labs. This is more than 300 machine-years and the *largest computational usage ever for any SMT (Satisfiability Modulo Theories) solver*, with more than 1 billion constraints processed to date.

SAGE is so effective at finding bugs that, for the first time, we faced "bug triage" issues with dynamic test generation. We believe this effectiveness comes from being able to fuzz large applications (not just small units as previously done with dynamic test generation), which in turn allows us to find bugs resulting from problems across multiple components. SAGE is also easy to deploy, thanks to x86 binary analysis, and it is fully automatic. SAGE is now used daily in various groups at Microsoft.

Symbolic execution: challenges

Some of the challenges that symbolic execution has to face:

- 1. memory model
- 2. path explosion
- 3. environment interaction
- 4. constraint solver

Depending on the goals, different choices and trade-offs must be made in order to effectively use symbolic execution.

Symbolic Execution: memory model

How do we handle symbolic loads or symbolic writes?

Approaches:

- 1. fully symbolic: consider any possible outcome
- 2. fully concrete: consider one possible outcome
- 3. **partial**: concretize writes, concretize loads when hard







N states accurate but not scale

1 state scale but not accurate

K states scale but (in)accurate

Symbolic Execution: path explosion

When possible, pre-constrain your symbolic inputs:

- → none
- → known size
- → known prefix
- → concrete values

Exploit knowledge from the application domain to limit path explosion!

For instance: some fields of a packet in a protocol are constant, other fields can assume a restricted set of values, etc.

Symbolic Execution: path explosion (2)

State scheduling to prioritize interesting paths. Common strategies:

- depth first search: minimize resource consumption
- random path selection: minimize starvation
- coverage optimized search: maximize coverage
- buggy path first: aims at vulnerability detection

The search heuristic depends on the goal that you are trying to achieve!

Symbolic Execution: environment interaction

How to deal with library/system calls?

- 1. fully symbolic: symbolically execute OS
- 2. fully concrete: concretize & execute OS
- 3. approximation: API models describe

effects on the state



accurate but not scale

scale but not accurate



scale but manpower costly and error-prone

Environment is often a source of input. Approximation is often used in practice.

Symbolic Execution: concolic execution

Concolic execution: concrete + symbolic. A mixed static/dynamic approach.

Key idea:

- 1. Run code concretely and record instruction trace
- 2. Symbolically analyze trace
- 3. Choose one branch, negate it, and generate new input values
- 4. Restart from (1) using the new inputs

Symbolic Execution: concolic execution (2)

Some of the benefits:

- 1. Symbolic execution is driven by a concrete execution
 - easier to detect false positives (divergences)
 - one solver query for each path
- 2. Exploit concrete values to solve hard constraints:

if
$$(a == (b * b % 50))$$

Hard to solve when **a** and **b** are fully symbolic Easy to solve when **b** is concrete and **a** is symbolic

Do you want to know more about Symbolic Execution?

Check out our survey!

Roberto Baldoni, Emilio Coppa, Daniele Cono D'Elia, Camil Demetrescu, Irene Finocchi. A Survey of Symbolic Execution Techniques. ACM Computing Surveys (ACM CSUR), 51(3), 2018.

DOI: <u>10.1145/3182657</u>

PDF: [URL]

A Survey of Symbolic Execution Techniques

ROBERTO BALDONI, EMILIO COPPA, DANIELE CONO D'ELIA, CAMIL DEMETRESCU, and IRENE FINOCCHI, Sapienza University of Rome

Many security and software testing applications require checking whether certain properties of a program hold for any possible usage scenario. For instance, a tool for identifying software vulnerabilities may need to rule out the existence of any backdoor to bypass a program is authentication. One appreach would be to test the program using different, possibly random inputs. As the backdoor may only be hit for very specific programs are eigent solution to the problem by systematically exploring many possible execution provides an elegant solution to the problem by systematically exploring many possible execution paths at the same time without necessarily requiring concrete inputs. Rather than taking on fully specified input values, the technique abstractly represents them as symbols, rescriting to constraint solvers to constraint actual instance that would cause property violations. Symbolic execution has been incubated in dozens of tools developed over the last four decade, leading to major practical brackthroughs in a number of prominent software reliability applications. The goal of this survey is to provide an overview of the main ideas, challenges, and solutions developed in the area, distilling them for a broad audience.

CCS Concepts: • Software and its engineering → Software verification; Software testing and debugging; • Security and privacy → Software and application security;

Additional Key Words and Phrases: Symbolic execution, static analysis, concolic execution, software testing

ACM Reference Format:

Roberto Baldoni, Emilio Coppa, Daniele Cono D'Elia, Camil Demetrescu, and Irene Finocchi. 2018. A Survey of Symbolic Execution Techniques. ACM Comput. Surv. 51, 3, Article 0 (2018), 37 pages. https://doi.org/0000001. 0000001

> "Sometimes you can't see how important something is in its moment, even if it seems kind of important. This is probably one of those times."

> > (Cyber Grand Challenge highlights from DEF CON 24, August 6, 2016)

1 INTRODUCTION

Symbolic execution is a popular program analysis technique introduced in the mid "70s to test whether certain properties can be violated by a piece of software [16, 58, 67, 68]. Aspects of interest could be that no division by zero is ever performed, no NUL pointer is ever dereferenced, no backdoor exists that can bypass authentication, etc. While in general there is no automated way to decide some properties (e.g., the target of an indirect jump), heuristics and approximate analyses can prove useful in practice in a variety of settings, including mission-critical and security applications.

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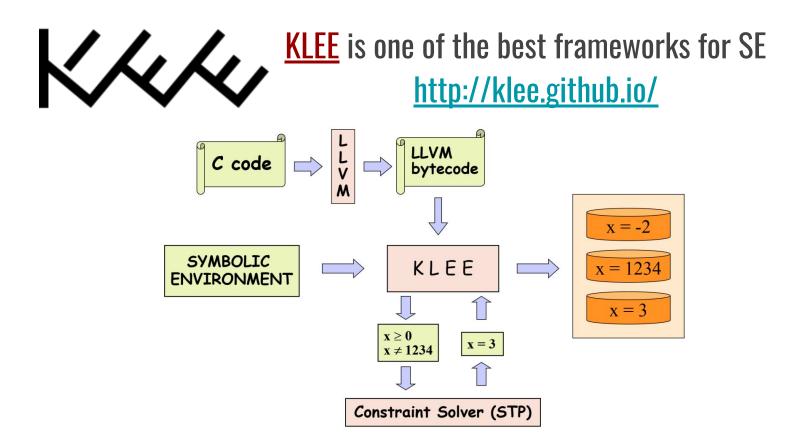
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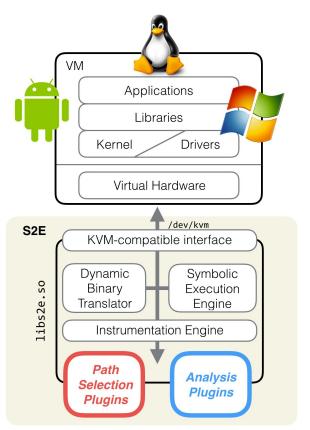
ACM Computing Surveys, Vol. 51, No. 3, Article 0. Publication date: 2018.

Hands-on Session

Framework for software testing (source code)



Framework for software testing and malware analysis (binary code)



S2E: complex but very powerful full stack analysis

https://s2e.systems/

angr: a python framework for analyzing binaries



Support for:

- CFG reconstruction
- (Static) Symbolic Execution
- Static Binary Analysis
- ...a lot more...

Extremely easy to prototype new ideas (e.g., novel program analyses) with angr!







angr @ DARPA CGC

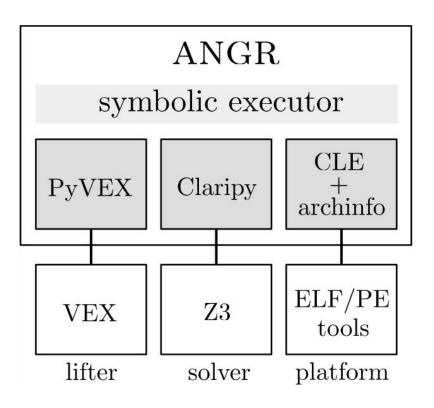
angr was the core of the MechaPhish CRS that played at the DARPA Cyber Grand Challenge.

This was a competition where fully autonomous systems have to detect, patch, and exploit software.

More details: phrack.org/papers/cyber-grand-shellphish.html

MechaPhish and angr are developed by the Computer Security Lab @ UC Santa Barbara. This is the research group of Giovanni Vigna!

angr: architecture



Components:

- PyVEX: lifter based on VEX (valgrind) for reasoning on binary code. Makes angr architecture-independent!
- Claripy: solver abstraction. Support for Microsoft Z3 solver.
- CLE/archinfo: ELF/PE loaders. It handles platform details.

angr: let's start using it!

Get the materials for this hands-on:

- > git clone https://tinyurl.com/SymbExec
- > cd SymbExec

Installation of angr on the CC20 Sapienza VM:

- approach #1 (easy, old release, based on Python 2):
 - > ./setup/install-angr-CC20.sh
 - > workon angr2

angr: let's start using it!

Get the materials for this hands-on:

- > git clone https://tinyurl.com/SymbExec
- > cd SymbExec

Installation of angr on the CC20 Sapienza VM:

- approach #2 (harder, latest release, based on Python 3):
 - > docker pull angr/angr

OFF TOPIC: do you know how to use docker containers?

If the answer is NO, we should spend a bit of time on it!



Intro to docker: https://smancke.github.io/docker-intro/

Setup on VM BIAR 1.6.5

Start the VM, open a terminal:

```
> cd ~/Desktop/
> git clone https://tinyurl.com/SymbExec
> cd SymbExec
```

Install angr and IDA:

- > ./setup/install-angr.sh
- > ./setup/install-IDA.sh

angr: let's start using it!

Installation on LXLE-BIAR-1.6.5 VM:

- > python2 -m pip install --upgrade --user pip
- > python2 -m pip install --user angr

angr has been recently ported to Python 3. It does not work correctly on the LXLE-BIAR VM.

angr: how to use it?

To symbolic execute a binary, you need to:

1. choose exploration targets:

- a. [start target] where (code address) start the execution
- b. [find target] where (code address) stop the execution
- c. [avoid targets] which paths (code addresses) ignore

2. Define the symbolic inputs

angr does not know what is symbolic and what is concrete. User has to mark it explicitly.

Unlikely that angr will reach the find target if the start target is the binary entry point!

Avoid targets are needed to limit path explosion!

Exercise #1: analyze our initial example [assertion fail]

```
> cd slide-example
> ../setup/run-IDA.sh
```

Analyze with IDA the binary **slide-example/example**

If you want to use IDA on Windows, download the binary at:
https://github.com/ercoppa/symbolic-execution-tut-orial/raw/master/slide-example/example

Exercise #1: target addresses and symbolic inputs

000000000004005BC mov

00000000004005C1 mov

000000000004005C6 mov

00000000004005CB mov

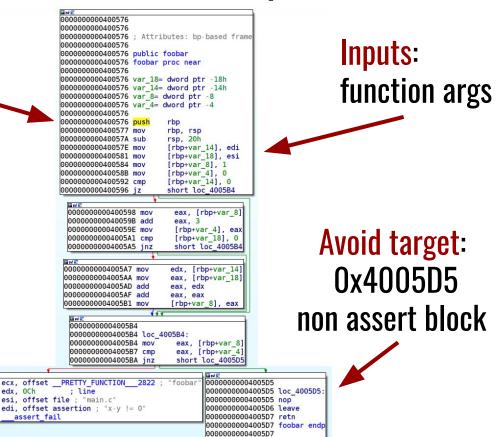
000000000004005D0 call

Start target: 0x400576 first instruction of foobar

Target addresses may change if you re-compile the example.c source file!

Find target: 0x4005BC

assert block



Exercise #1: angr script solve-example.py (1)

import angr proj = angr.Project('example') start = XXX # foobar avoid = [YYY] # non assert block end = ZZZ # assert block # blank state since arbitrary point state = proj.factory.blank state(addr=start) # arguments are inside registers in x86 64 a = state.regs.edi b = state.regs.esi

Exercise #1: angr script solve-example.py (2)

```
sm = proj.factory.simulation manager(state)
while len(sm.active) > 0:
    print(sm) # info
    sm.explore(avoid=avoid, find=end, n=1)
    if len(sm.found) > 0: # Bazinga!
       print("\nReached the target\n")
       state = sm.found[0]
       print("%edi = " + str(state.se.eval upto(a, 10)))
       print("%esi = " + str(state.se.eval upto(b, 10)))
       break
```

Exercise #1: run it!

```
> python solve-example.py
<SimulationManager with 1 active>
<SimulationManager with 2 active>
<SimulationManager with 3 active>
<SimulationManager with 3 active, 1 avoid>
                                   This solution was unexpected!
Reached the target
                                   Is it valid? Yes. But why?
%edi = [2L, 2147483650L]
%esi = [0]
> ./example 2 0
example: example.c:12: foobar: Assertion `x-y != 0' failed.
Aborted
> ./example 2147483650 0
example: example.c:12: foobar: Assertion `x-y != 0'
failed.Aborted
```

angr: useful API

Expressions:

angr: useful API (2)

Exploration:

```
- Create project: p = angr.Project('binary')
- blank State: state = p.factory.blank_state(addr=start)
- entry State: state = p.factory.entry_state()
```

- simulation engine:

```
sm = proj.factory.simulation_manager(state) # create it
sm.explore(avoid=avoid, find=end, n=1) # explore 1 BB
sm.explore(avoid=avoid, find=end)
sm.active # list of active states
sm.found # list of found states
sm.avoid # list of avoided states
```

angr: useful API (3)

Registers:

- get expr from a register: expr = state.regs.eax
- put expr into a register: state.regs.eax = expr

Memory: keep in mind the endianness!

- read bytes from memory: expr = state.memory.load(0xABC, 4)
- Store exprinto a register: state.memory.store(0xABC, expr, 4)

```
Stack pop expr: expr = state.stack_pop()
Stack push expr: state.stack_push(expr)
```

angr: useful API (4)

Constraint solver:

- add a constraint: state.add_constraints(expr)
- get a numeric solution: val = state.solver.eval(expr)
- get K numeric solutions: v = state.solver.eval_upto(expr, K)
- get a solution as string:

```
S = state.solver.eval(arg, cast_to=bytes)
```

```
S = S.split(b' x00')[0].decode('ascii')
```

angr: useful API (5)

Hook:

```
def custom_hook(state):
    state.regs.eax = state.solver.BVS('input', 32)
    state.add_constraints(
        state.solver.And(state.regs.eax > 0, state.regs.eax < 10))
proj.hook(0x4011BE, hook=custom_hook, length=5)</pre>
```

custom_hook will be executed when instruction pointer is at 0x4011BE Since length=5, angr will skip 5 bytes from the code when executing the hook, recovering execution from 0x4011BE+0x5.

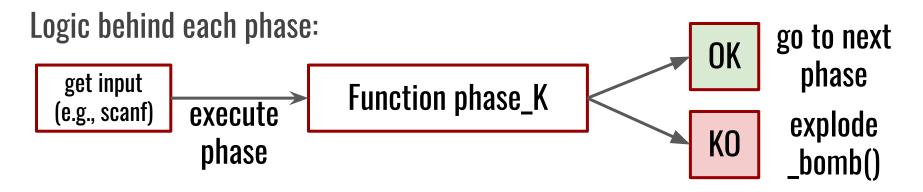
Hooks helps bypassing complex functions/instrs or OS interactions.

To write robust API models, angr offers SimProcedures (see documentation)

Exercise #2: logic bomb

It's the same logic bomb that you have already solved in a prev training lecture. You can run it on Windows or Linux [after installing wine (not possible on VM BIAR): sudo apt install wine].

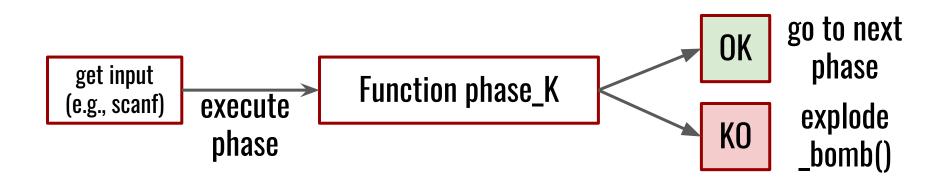
Binary: bomb/bomb.exe



Exercise #2: logic bomb

It's the same logic bomb that you have already solved in a prev training lecture. Binary: linux-bomb/bomb

Logic behind each phase:



Exercise #2: phase 1

The bomb has blown up.

```
> cd linux-bomb
> ./bomb

Welcome to my fiendish little bomb. You have 6 phases with which to blow yourself up. Have a nice day!

TEST_TEST_TEST typed the wrong solution
```

Exercise #2: phase 1

The bomb has blown up.

Exercise #2: target addresses and input

start target: begin of **Input**: first argument, pointer to a string phase_1() 00000000000400FF0 0000000000400EE0 0000000000400EE0 0000000000400EE0 public phase 1 0000000000400EE0 phase 1 proc near 00000000000400EE0 sub rsp, 8 esi, offset aBorderRelation ; "Border relations with Canada have never"... 0000000000400EE4 mov avoid target: 00000000000400EE9 call strings not equal 00000000000400EEE test eax, eax 0000000000400EF0 jz short loc 400EF7 block calling **1** 14 52 0000000000400EF2 call explode bomb 0000000000400EF7 bomb_explode() 0000000000400EF7 loc 400EF7: 0000000000400EF7 rsp, 8 00000000000400EFB retn 0000000000400EFB phase 1 endp find target: block returning 0000000000400EFB to main function

Exercise #2: target addresses and input

```
start target: begin of
                                       ; Attributes: bp-based frame
phase_1()
                                       sub 401190 proc near
                                      arg 0= dword ptr 8
Input: first argument,
                                       push
                                              ebp
                                              ebp, esp
                                       mov
                                              offset aPublicSpeaking; "Public speaking is very easy."
                                       push
pointer to a string
                                              eax, [ebp+8]
                                       mov
                                       push
                                              eax
                                              sub 401740
                                       call
                                       add
                                              esp, 8
avoid target: block
                                       test
                                              eax. eax
                                              short loc 4011AD
calling bomb_explode()
                                                                     A
                                                    call
                                                           sub 401960
                                                                     loc 4011AD:
find target: block returning
                                                                            ebp
                                                                     gog
                                                                     retn
to main function
                                                                     sub 401190 endp
```

Exercise #2: discussion script of phase #1 (solution)

Exploration targets:

Exercise #2: discussion script of phase #1 (solution)

Exploration targets:

Exercise #2: new angr bits from phase-1.py

```
# a symbolic input string with a length up to 128 bytes
arg = state.solver.BVS("input string", 8 * 128)
# an ending byte
arg_end = state.solver.BVV(0x0, 8) | Alternative approach:
                                    arg_end = state.se.BVS("end_input_string", 8)
                                     state.add constraints(arg end == 0x0)
# concat arg and arg end
arg = state.solver.Concat(arg, arg end)
bind addr = 0x603780 # read line() is storing here the input string
# store the symbolic string at this address
state.memory.store(bind addr, arg)
# set arg
state.regs.rdi = bind addr
```

Exercise #2: new angr bits from phase-1.py

```
# a symbolic input string with a length up to 128 bytes
arg = state.solver.BVS("input string", 8 * 128)
# an ending byte
arg_end = state.solver.BVV(0x0, 8)
Alternative approach:
                                    arg_end = state.se.BVS("end_input_string", 8)
                                    state.add constraints(arg end == 0x0)
# concat arg and arg end
arg = state.solver.Concat(arg, arg end)
bind addr = 0x603780 # read line() is storing here the input string
# store the symbolic string at this address
state.memory.store(bind addr, arg)
# push string address into the stack
state.stack push(state.se.BVV(bind addr, 32))
state.stack push(state.se.BVV(0x0, 32))
```

Exercise #2: phase #1 (execution)

```
> python phase-1.py
<SimulationManager with 1 active>
[...] // after 2 minutes

Reached the target
<SimulationManager with 1 found, 35 active, 101 avoid>
Solution: Public speaking is very easy.
> ./bomb.exe # you can run it on Linux using wine
Welcome to my fiendish little bomb. You have 6 phases with
```

Border relations with Canada have never been better.

Phase 1 defused. How about the next one? [...]

which to blow yourself up. Have a nice day!

Exercise #2: now move on to other phases!

Hints:

- 1. use phase-1.py as a template to edit for other phases
- 2. check previous slides on angr API
- 3. detect start/find/avoid target addresses
- 4. try to avoid OS interactions
- 5. understand the execution context of each phase: where the input is expected to be found, what assumptions can be made on it to help SE

Good luck!

Ask me questions!