



## (State of) The Art of War: Offensive Techniques in Binary Analysis

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## Symbolic Execution with angr

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# Introduction: Why angr?

- Tool for the research community for reproducing, improving and creating analysis techniques
- Design Goals
  - cross-architecture/platform support
  - modularity for different analysis
  - easy reproduction of analysis techniques  
(under-constrained symbolic execution = 2 days)
- For use in the DARPA Cyber Grand Challenge  
(i.e., automating binary analysis)

# Automated Binary Analysis

2 main trade-offs for feasibility

## **Replayability**

- understanding how to trigger the vulnerability

## **Semantic insight**

- understanding why code is executed
- understanding what part of the input caused the behavior

# Background

## **Static Vulnerability Discovery**

- ✗ Control Flow Graph (CFG) Recovery
- ✗ Value Set Analysis (VSA)

## **Dynamic Vulnerability Discovery**

- ✓ Dynamic Symbolic Execution (SE)
  - with veritesting to mitigate path explosion
- ✓ Under-constrained Symbolic Execution
- ✗ Symbolic Assisted Fuzzing (angr + AFL = Driller)

# Symbolic Execution: Intuition

$$\begin{aligned}x &\in N_{\emptyset} \\ x + y &= 5\end{aligned}$$

Q: What is the value of  $x$ ?

# Symbolic Execution: Intuition

$$\begin{aligned}x &\in \mathbb{N}_0 \\ x + y &= 5\end{aligned}$$

Q: What is the value of  $x$ ?

**A: infinitely many values, but depends on  $y$**

# Symbolic Execution: Intuition

$$\begin{aligned}x &\in N_0 \\x + y &= 5 \\xy &= 0\end{aligned}$$

Q: What is the value of  $x$ ?



# Symbolic Execution: Intuition

$$\begin{aligned}x &\in N_0 \\x + y &= 5 \\xy &= 0\end{aligned}$$

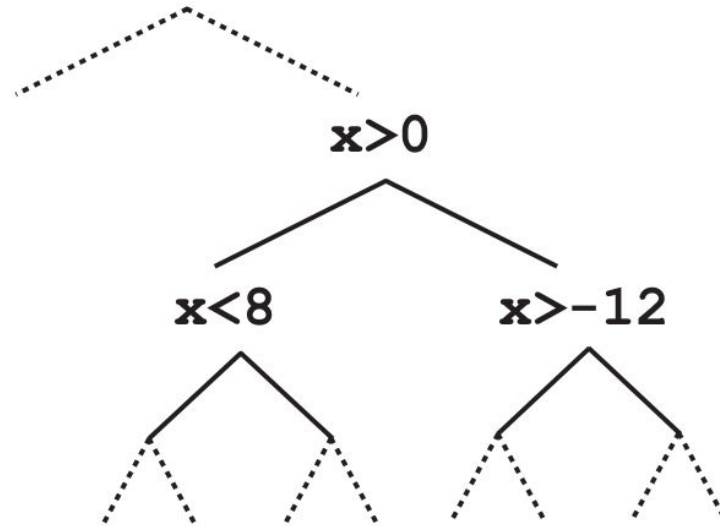
Q: What is the value of  $x$ ?

**A:  $x \in \{0, 5\}$**

# Symbolic Execution: Intuition

During execution we maintain a set of paths, each with an associated set of symbolic values and constraints.

```
I = <input>;  
x = I-2;  
if (x > 0) {  
    if (x < 8) {  
        ...  
    }  
    else {  
        if (x > -12) {  
            ...  
        }  
    }  
}
```



# Symbolic Execution: Intuition

Want to know more?

There is a long  
lecture from  
MITOpenCourseware<sup>[3]</sup>

Check it out!



Where there is anger  
there is always pain  
underneath.

# Analysis Engine: Overview

- Implemented mainly in Python
- Intended to be used with IPython
- Can be run in PyPy to reduce language overhead (i.e., increased speed)

# Analysis Engine: CLE

**PROBLEM:** How do we run analysis on a binary?

**SOLUTION:** Use a “binary loader”

- CLE Loads Everything
- Loads the binary and library dependencies in a meaningful way for angr to work with...

# Analysis Engine: CLE

In angr the Project class exposes the CLE module to the user

```
>>> import angr  
  
>>> b = angr.Project("/bin/grep")  
  
>>> print b.filename, hex(b.entry)  
  
/bin/grep 0x404ca8
```

# Analysis Engine: libVEX

**PROBLEM:** How do we support different architectures (i.e., ARM, MIPS, x86, etc.)?

**SOLUTION:** Translate the binary to a common intermediate representation (IR)

- Known as an “IR lifter”
- libVEX is implemented by the Valgrind project
- Produces VEX IR which is exposed to Python by PyVEX



# Analysis Engine: libVEX

In angr the PyVEX module is exposed by the `Project.factory.block` interface.

```
>>> import angr
>>> b = angr.Project("/bin/grep")
>>> b.factory.block(b.entry).size      # in bytes
41

# pretty-print the VEX IR of the entry block
>>> ir = b.factory.block(b.entry).vex
>>> ir.pp()
```

# Analysis Engine: Claripy Solvers

- angr's data model provider
- Claripy has different Solvers for different analyses
- Uses `Z3.Solver` for SE constraint solving<sup>[2]</sup>
- provides symbolic values through AST's for SE
  - bit-vectors (`Claripy.BVS`)
- SimVEX module handles most internal interactions with Claripy.

# Analysis Engine: Claripy Solvers

```
# create a solver
>>> import claripy
>>> s = claripy.Solver()

# symbolic 4-bit value named `x`
>>> sym_x = claripy.BVS('x', 4)
>>> assert sorted(s.eval(sym_x, 16)) == range(16)

# now reset and add an unsigned less than condition
>>> sym_x = claripy.BVS('x', 4)
>>> s.add(claripy.ULT(sym_x, 5))
>>> print sorted(s.eval(sym_x, 16))
[0, 1, 2, 3, 4]
```

# Analysis Engine: SimuVEX

- controls program state representation and makes modifications to the state
- a symbolic VEX emulator (SimEngines)  
input: state + VEX block  
output: state[]
- tracks both concrete and symbolic values for memory, registers, open files, etc.
- `SimState` objects are accessed from the `Project.factory`

# Analysis Engine: SimuVEX

```
>>> import angr, simuvex
>>> b = angr.Project('/bin/grep')

# we can get a state at the entry point
>>> s = b.factory.entry_state()

# we can access data from the register values
>>> print "Stack pointer is at: ", s.regs.sp
>>> print "Instruction pointer is at: ", s.regs.ip

# s.se is the solver engine with symbolic constraints on the state
# also note the endianness is big-endian by default
>>> print s.se.any_int(s.regs.eax)
>>> print s.se.any_int(s.memory.load(0x2000, 4, endness='Iend_LE'))
```

# Analysis Engine: SimuVEX

```
# we can create and store data in registers, in memory, on the stack...
>>> aaaa = claripy.BVV(0x41414141, 32) # 32-bit 'aaaa'
>>> s.regs.eax = aaaa
>>> s.memory.store(0x1000, aaaa)
>>> s.stack_push(aaaa)
>>> s.stack_pop(aaaa)

# we can copy states
s1 = s.copy()
s2 = s.copy()

# we can merge states
(s_merged, m, any_merged) = s1.merge(s2)

# then analyze the merged state
s_merged.se.any_n_int(aaaa)
```

# Analysis Engine: SimuVEX

```
# we can check if a value is symbolic
```

```
>>> assert s.se.symbolic(aaaa)
```

```
# we can check which symbolic variables make up an expression
```

```
>>> print s.se.variables(aaaa)
```

# SE Top Level

- `Path` primary interface to control execution
- `PathGroup` a lot of `Paths` being executed
- `Hook` allows angr to intercept program execution at a specific memory address.
- `SimProcedures` symbolically implement a function (i.e., library functions)



# SE Top Level: Paths

```
>>> import angr
>>> b = angr.Project('/bin/grep')

# get a path
>>> p = b.factory.path()

# the path will load at the binary's entry point
>>> p.addr == b.entry

>>> p.length      # number of VEX blocks analyzed in path (0 right now)
>>> p.callstack   # current backtrace

# see how many successor paths exist
>>> p.step()
>>> print len(p.successors)
```

# SE Top Level: PathGroups

- These are the self-professed future of angr
- Basically bulk execution of Paths
- Paths organized into stashes  
(i.e., found, avoided, deadended, errored, etc.)
- PathGroup.Explorer() allows for stepping using find, avoid and until parameters

# SE Top Level: PathGroups

```
>>> import angr
>>> p = angr.Project('any_binary')
>>> pg = p.factory.path_group()

# try to reach a specific address
>>> pg.explore(find=0x4016A0)

# OR try to reach a specific address
>>> pg.explore(find=0x4016A0, avoid=[0x403200, 0x4032A1])

# OR try to find specific output
>>> pg.explore(find=lambda p: "Approved!" in p.state.posix.dumps(1))
>>> pg.found[0].state.posix.dumps(1)      # stdout
enter passwd: Approved!
>>> print pg.found[0].state.posix.dumps(0)      # stdin, the password
im_so_angr_e
```

# SE Top Level: Hooks

- hooks let angr intercept a binary's execution at a specific memory address and redefine its behavior
- `Project.hook(address, procedure, length)`
- the procedure can be a Python function or `SimProcedure`

# SE Top Level: Hooks

```
def set_rax(state):
    state.regs.rax = 10

# hook the mem address with given SimProcedure,
# then skip length bytes and resume execution
>>> b.hook(0x10000, set_rax, length=5)

>>> b.is_hooked(0x10000)
>>> b.unhook(0x10000)

# insert hook by symbol
>>> b.hook_symbol('strlen',
                  simuvex.SimProcedures['stubs']['ReturnUnconstrained'])
```

# SE Top Level: SimProcedure

```
>>> from simuvex import SimProcedure
>>> from angr import Hook, Project
>>> project = Project('any_binary')

# define a SimProcedure with a run() method
>>> class BypassMain(SimProcedure):
...     def run(self, argc, argv):
...         print 'argc=%s and argv=%s' % (argc, argv)
...         return 0

# assuming a binary with symbols
>>> project.hook(project.kb.labels.lookup('main'), Hook(BypassMain))
>>> pg = project.factory.path_group()

# step until no more active paths
>>> pg.run()
```

# Implementation: Dynamic SE

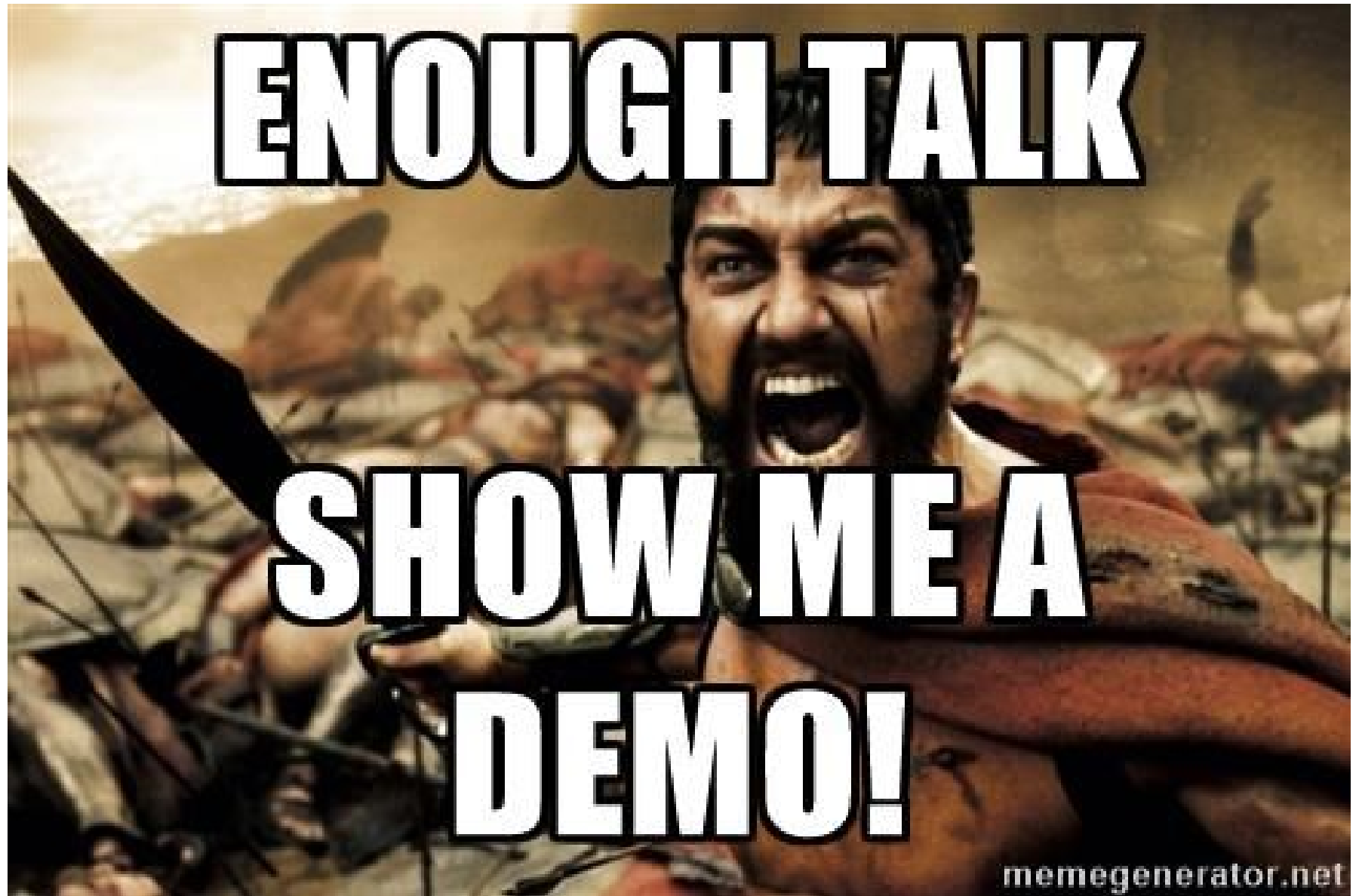
- Uses `Claripy` interface into `Z3.Solver` to populate the symbolic memory model
- `Path` objects for each execution path
- Managed in `PathGroup`, allows
  - splitting
  - merging
  - filtering

# Implementation: Under-constrained SE

- UC-angr is modeled after UC-KLEE with some differences
  - Global data is under-constrained
  - 64 path limit on functions
  - False positive filtering

```
# Use a blank state and arbitrary starting point
>>> import angr
>>> point_of_entry = 0x0800b000
>>> b = angr.Project('any_binary')
>>> start = b.factory.blank_state(addr=point_of_entry)
>>> path = b.factory.path(start)
```





# Comparative Evaluation

Technique	Replayable	Semantic Insight	Scalability	Crashes	False Positives
Dynamic Symbolic Execution	Yes	High	Low	16	0
Dynamic Symbolic Execution + Veritesting	Yes	High	Medium	23	0
Under-constrained Symbolic Execution	No	High	High	25	346

# References

[1]

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