



Revisiting Program Analysis through the Security Lens

Journées Nationales du GDR GPL / AFADL 2023

FROM RESEARCH TO INDUSTRY

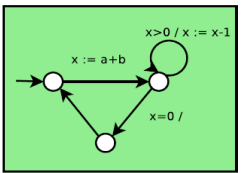
Sébastien Bardin

Senior Researcher, CEA Fellow

LSL/SABR

The BINSEC Group: ADAPT FORMAL METHODS TO BINARY-LEVEL SECURITY ANALYSIS

Model



Source code

```
int foo(int x, int y) {
  int k = x;
  int c = y;
  while (c > 0) do {
    k++;
    c--;
  }
  return k;
}
```

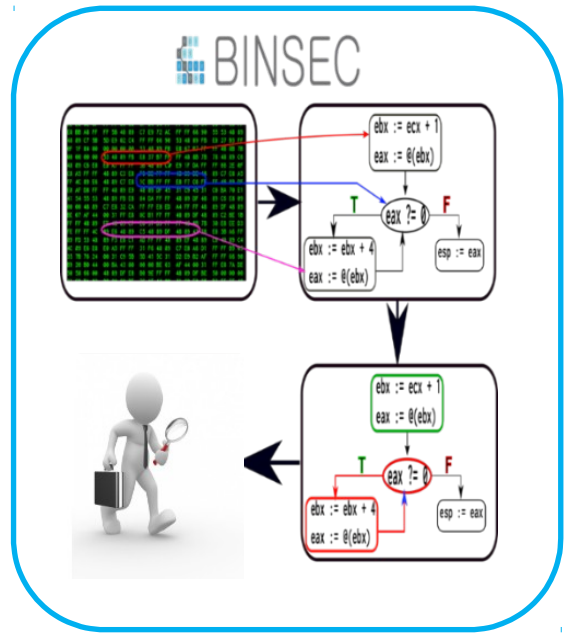


Assembly

```
_start:
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label:
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```

Executable

```
ABFFF780BD70696CA101001BDE45
145634789234ABFFE678ABDCF456
5A2B4C6D009F5F5D1E0835715697
145FEDBCADACBDAD459700346901
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00113456735FFD451E13AB080DAD
344252FFAADBDA457345FD780001
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```

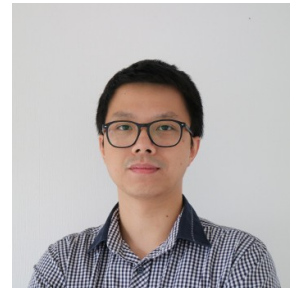
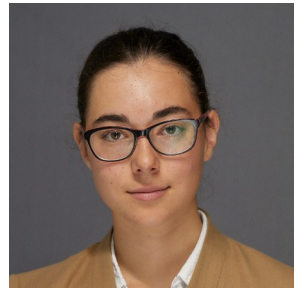
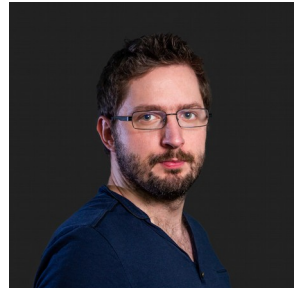
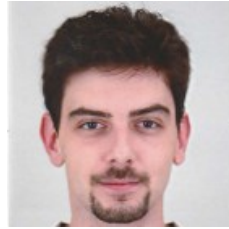
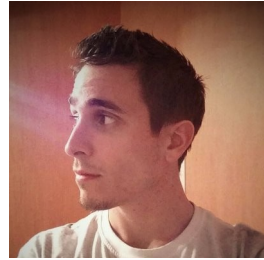
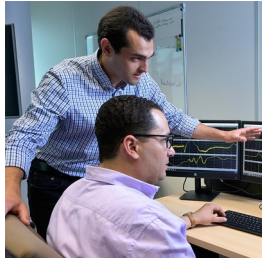


<https://binsec.github.io/>

• Looking for postdoc & PhD candidates

- **Program Analysis (PL) and Formal Methods come from critical safety needs**
 - Damn good there (in the hands of experts)
- **Now : a move from safety concerns to security concerns**
- **Questions:**
 - *how can we use standard PL/FM into a security context ?*
 - *how does code-level security differ from code-level safety?*
 - *how does security differ from safety ? [focus on the attacker]*
- ***This talk: share some insights from our biased experience [CAV 21, ESOP 2023]***

TEAM WORK SINCE 2012



Prologue : ABOUT FORMAL METHODS AND CODE ANALYSIS

- Between Software Engineering and Theoretical Computer Science
- Goal = proves correctness in a mathematical way

- Reason about the meaning of programs

Key concepts : $M \models \varphi$

- M : semantic of the program
- φ : property to be checked
- \models : algorithmic check

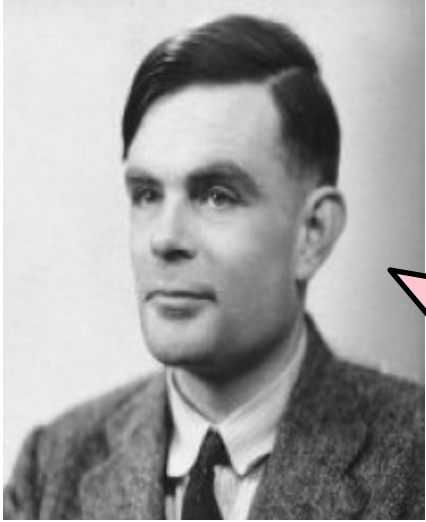
- Typical ingredients: transition systems, automata, logic, ...

- Reason about infinite sets of behaviours

Success in (regulated) safety-critical domains



They knew it was impossible, so they did it anyway



Cannot have analysis that

- Terminates
- Is perfectly precise

On all programs

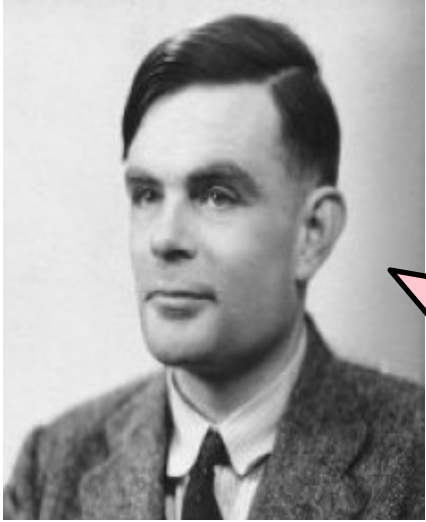
Answers

- Forget perfect precision: bugs xor proofs
- Or focus only on « interesting » programs
- Or put a human in the loop
- Or forget termination



- **Weakest precondition calculi** [1969, Hoare]
- **Abstract Interpretation** [1977, Cousot & Cousot]
- **Model checking** [1981, Clarke - Sifakis]

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Answers

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SYMBOLIC EXECUTION (Godefroid 2005)

Find real bugs

Bounded verification

Flexible

```

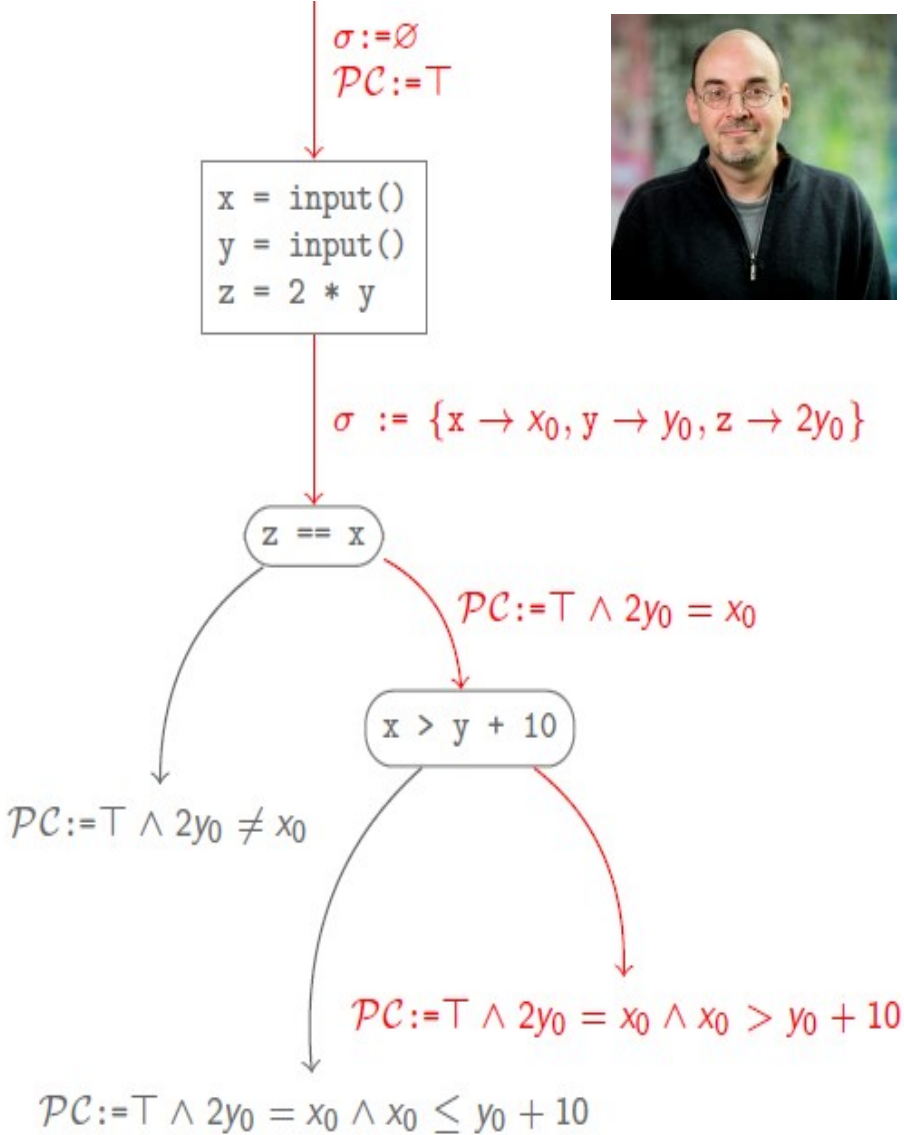
int main () {
  int x = input();
  int y = input();
  int z = 2 * y;
  if (z == x) {
    if (x > y + 10)
      failure;
  }
  success;
}

```

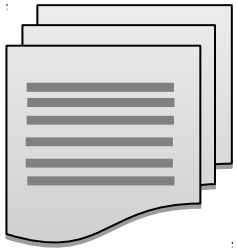


Given a path of a program

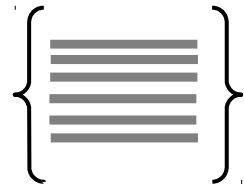
- Compute its « path predicate » f
- Solution of $f = \text{input}$ following the path
- Solve it with powerful existing solvers



SOURCE CODE



COMPILE



INLINE ASSEMBLY

ASSEMBLY CODE

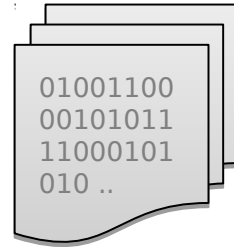


ASSEMBLE

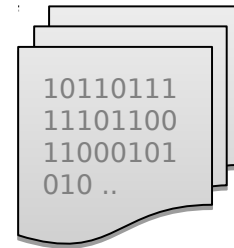


HAND WRITTEN ASSEMBLY

OBJECT CODE

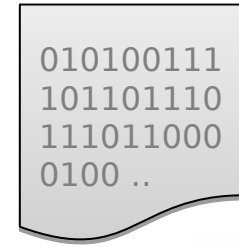


LINK



THIRD PARTY LIBRARY

EXECUTABLE



RUN



WHY GOING DOWN TO BINARY-LEVEL SECURITY ANALYSIS?

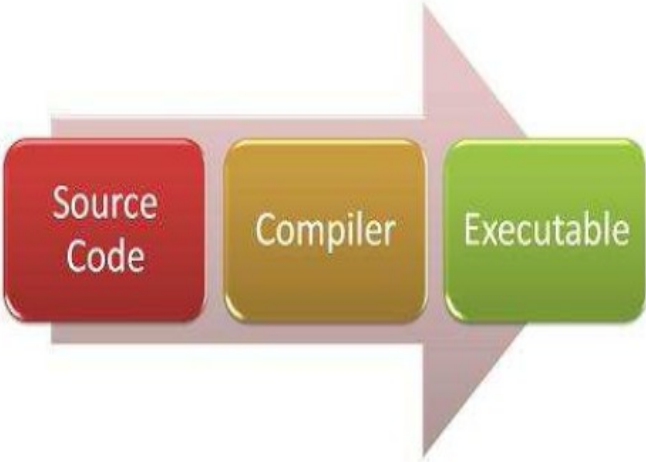
No source code



COTS



Post-compilation



Malware comprehension



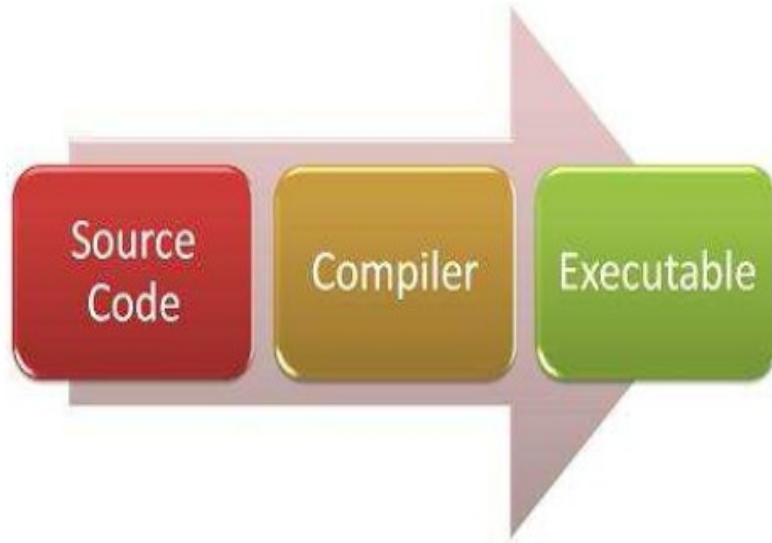
Protection evaluation



Very-low level reasoning



EXAMPLE: COMPILER BUG (?)



- Optimizing compilers may remove dead code
- `pwd` never accessed after `memset`
- Thus can be safely removed
- And allows the password to stay longer in memory

Security bug introduced by a non-buggy compiler

```
void getPassword(void) {  
    char pwd [64];  
    if (GetPassword(pwd,sizeof(pwd))) {  
        /* checkpassword */  
    }  
    memset(pwd,0,sizeof(pwd));  
}
```

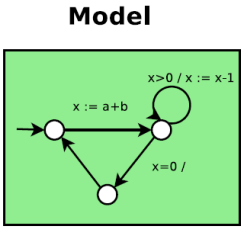
OpenSSH CVE-2016-0777

- **secure source code**
- **insecure executable**

- **Introduction**
- **Challenges of automated binary-level security analysis**
- **BINSEC & Symbolic Execution for Binary-level Security**
- **Robust reachability and bugs that matter**
- **Adversarial reachability**
- **Conclusion, Take away and Disgression**

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New challenges!



Source code

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int foo(int x, int y) {
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Assembly

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```



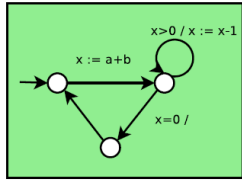
• Binary code

• Attacker

• Properties

New challenges!

Model



Source code

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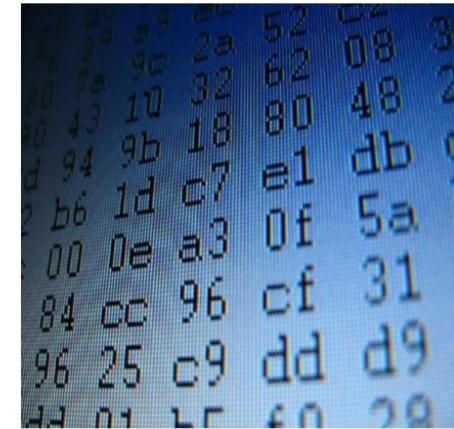
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```



• Binary code

• Attacker

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CHALLENGE: BINARY CODE LACKS STRUCTURE

- Instructions?
- Control flow?
- Memory structure?



DISASSEMBLY IS ALREADY TRICKY!

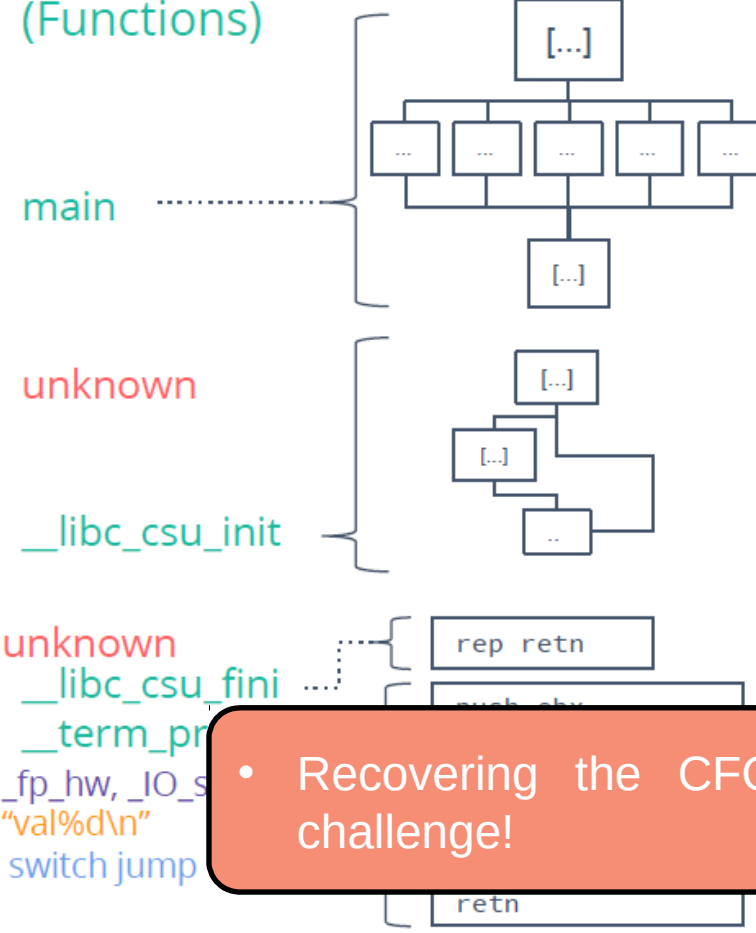
- code – data ??
- dynamic jumps (jmp eax)

Sections

.text	8D 4C 24 04 83 E4 F0 FF 71 FC 55 89 E5 53 51 83
	EC 10 89 CB 83 EC 0C 6A 0A E8 A7 FE FF FF 83 C4
	10 89 45 F0 8B 43 04 83 C0 04 8B 00 83 EC 0C 50
	E8 C0 FE FF FF 83 C4 10 89 45 F4 83 7D F4 04 77
	3B 8B 45 F4 C1 E0 02 05 98 85 04 08 8B 00 FF E0
	C7 45 F4 00 00 00 00 EB 23 C7 45 F4 01 00 00 00
	EB 1A C7 45 F4 02 00 00 00 EB 11 C7 45 F4 03 00
	00 00 EB 08 C7 45 F4 04 00 00 00 90 83 EC 08 FF
	75 F4 68 90 85 04 08 E8 29 FE FF FF 83 C4 10 8B
	45 F4 8D 65 F8 59 5B 5D 8D 61 FC C3 66 90 66 90
	66 90 66 90 90 55 57 31 FF 56 53 E8 85 FE FF FF
	81 C3 89 12 00 00 83 EC 1C 8B 6C 24 30 8D B3 0C
	FF FF FF E8 B1 FD FF FF 8D 83 08 FF FF FF 29 C6
	C1 FE 02 85 F6 74 27 8D B6 00 00 00 00 8B 44 24
	38 89 2C 24 89 44 24 08 8B 44 24 34 89 44 24 04
	FF 94 BB 08 FF FF FF 83 C7 01 39 F7 75 DF 83 C4
	1C 5B 5E 5F 5D C3 EB 0D 90 90 90 90 90 90 90
	90 90 90 90 90 F3 C3 FF FF 53 83 EC 08 E8 13 FE
.fini	FF FF 81 C3 17 12 00 00 83 C4 08 5B C3 03 00 00
.rodata	00 01 00 02 00 76 61 6C 3A 25 64 0A 00 AB 84 04
	08 B4 84 04 08 BD 84 04 08 C6 84 04 08 CF 84 04
	08 01 1B 03 3B 28 00 00 00 04 00 00 00 54 FD FF
.eh_frame_hdr	

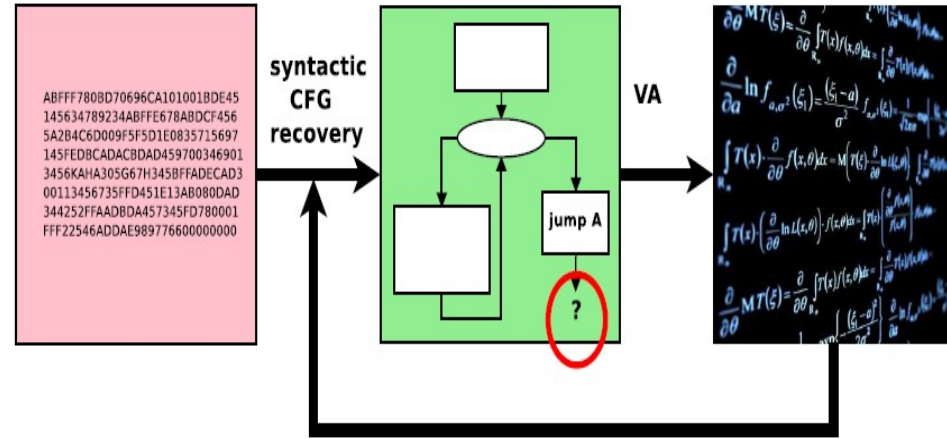
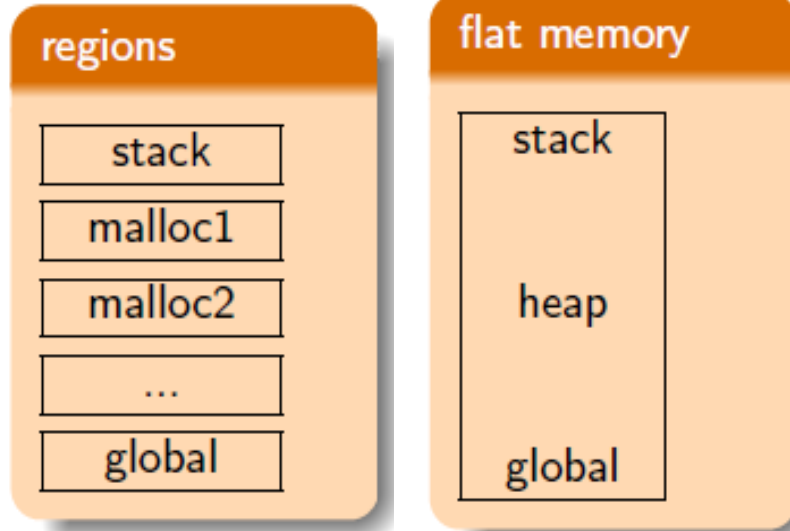
■ code ■ dead bytes ■ global csts ■ strings ■ pointers ■ other

Code (Functions)



• Recovering the CFG is already a challenge!

BINARY CODE SEMANTIC LACKS STRUCTURE



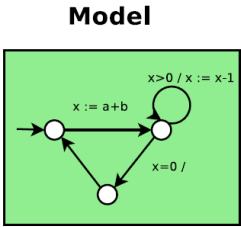
Problems

- Jump eax
- Untyped memory
- Bit-level reasoning

```
if (ax > bx) X = -1;
else X = 1;
```

```
OF := ((ax{31,31}#bx{31,31}) &
        (ax{31,31}#(ax-bx){31,31}));
SF := (ax-bx) < 0;
ZF := (ax-bx) = 0;
if (¬ ZF ^ (OF = SF)) goto l1
X := 1
goto l2
l1: X := -1
l2:
```

New challenges!



Source code

```
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  int c=y;
  while (c>0) do {
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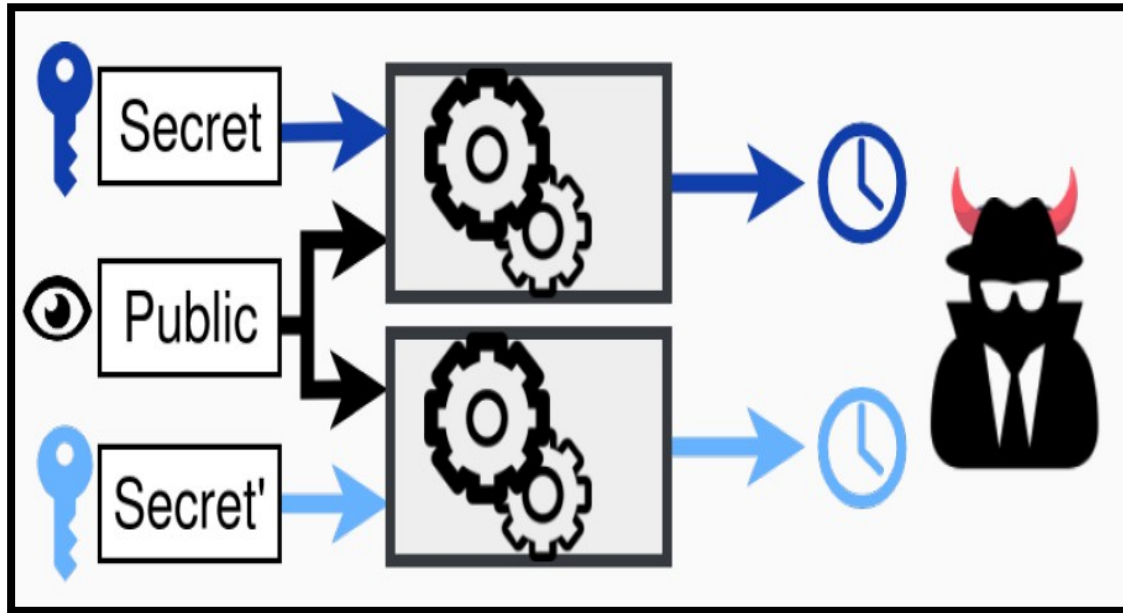
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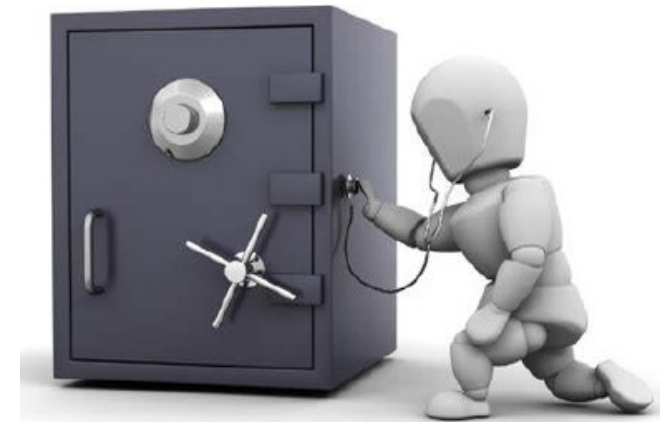
• Properties

New challenge : safety is not hyper-property :-)

Information leakage



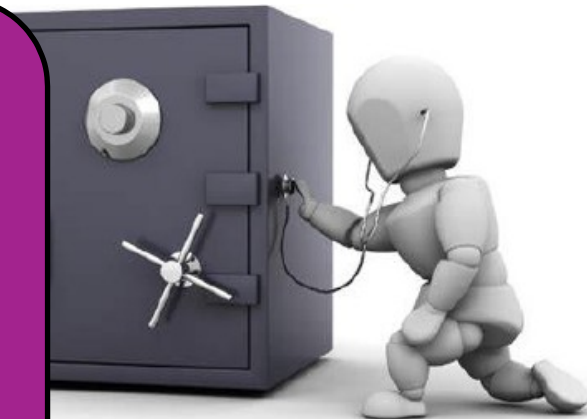
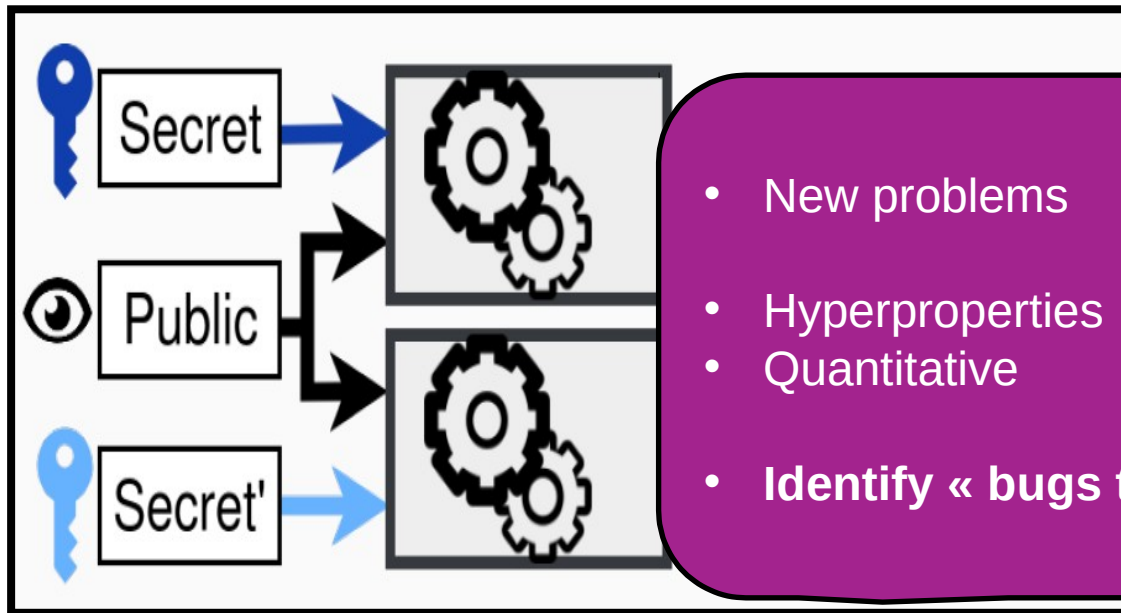
Properties over pairs of executions



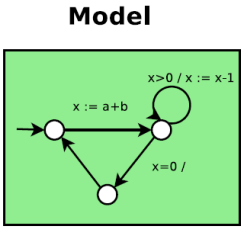
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```



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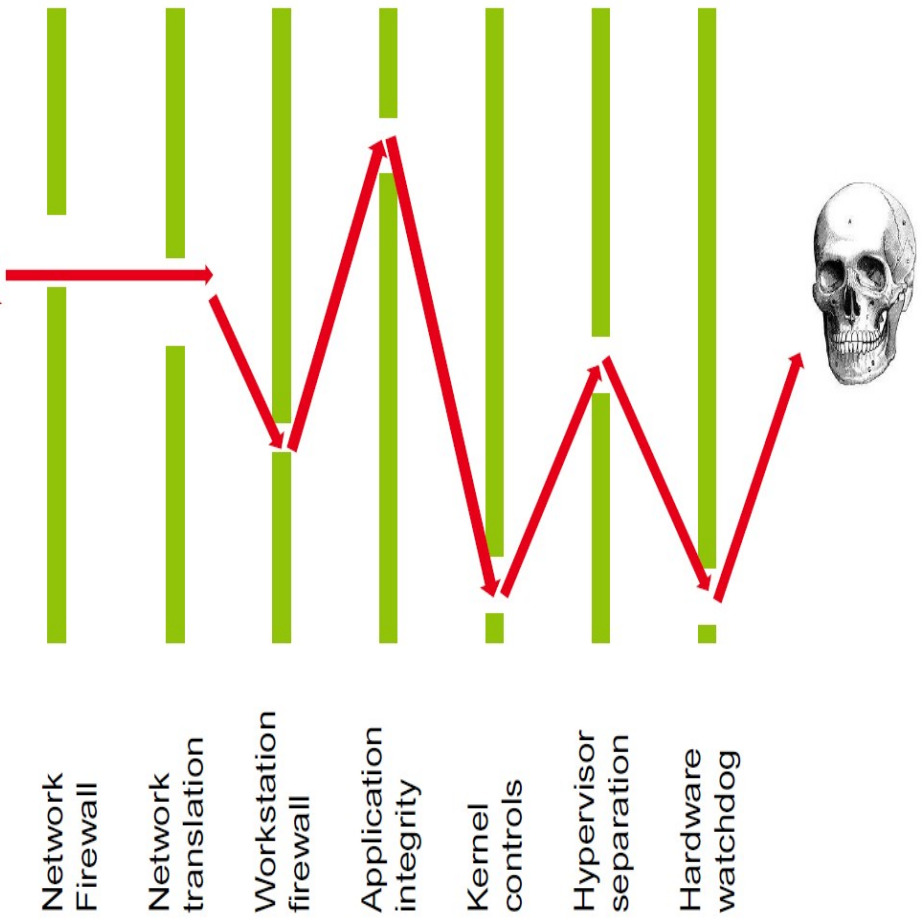
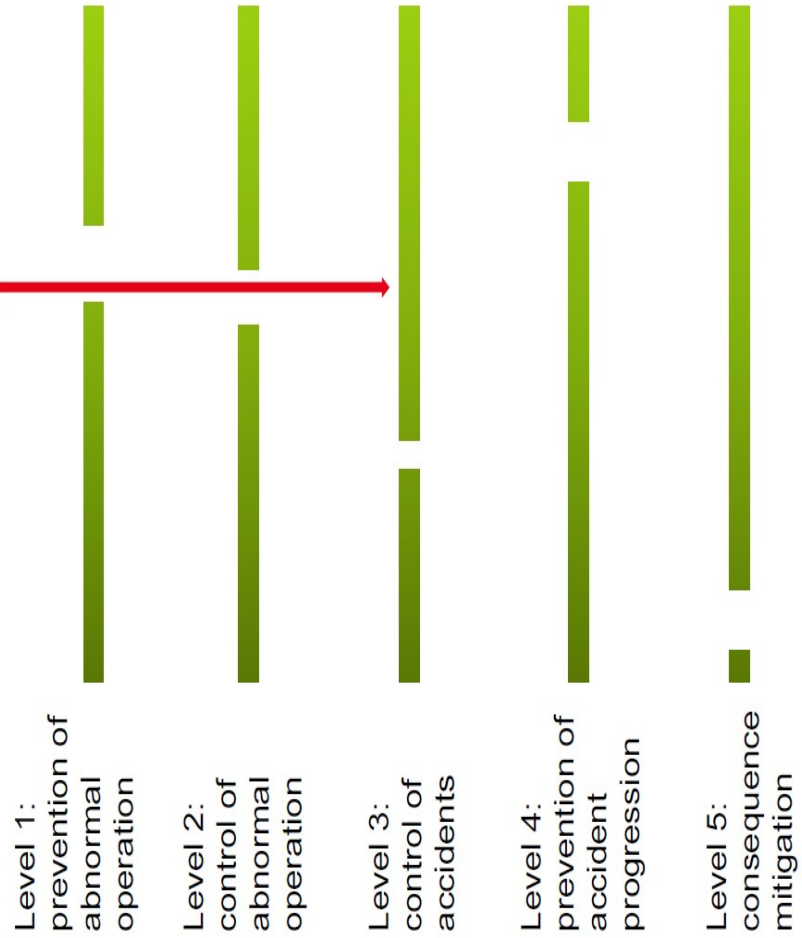
Main topic of the day

CHALLENGE: ATTACKER



Nature is not nice

Attacker is evil



ATTACKER in Standard Program Analysis

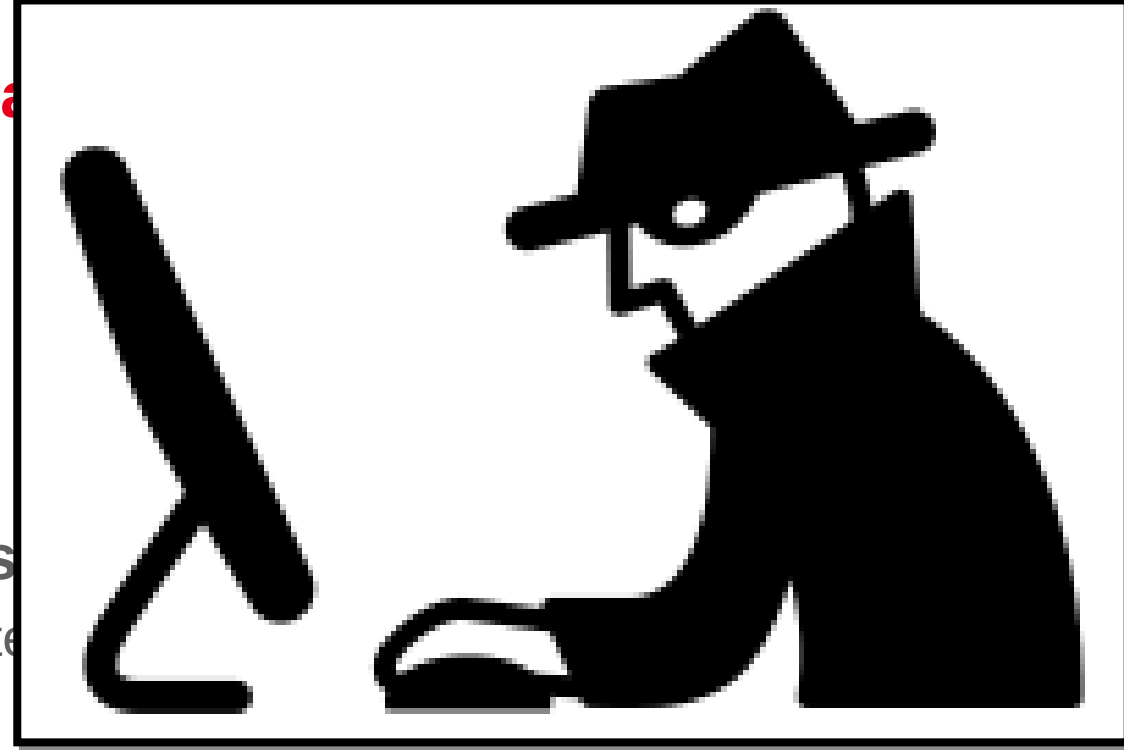


- We are reasoning worst case: seems very powerful!

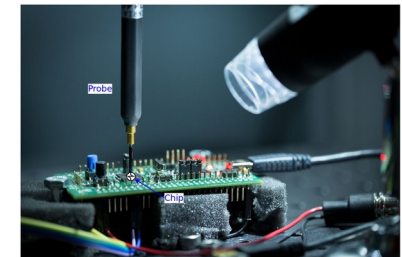
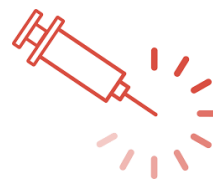
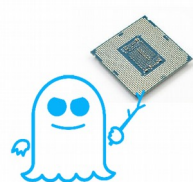


- We are reasoning worst case: seems very powerful!
- Still, our current attacker plays the rules: respects the program interface
 - Can craft **very smart input**, but only through **expected input sources**

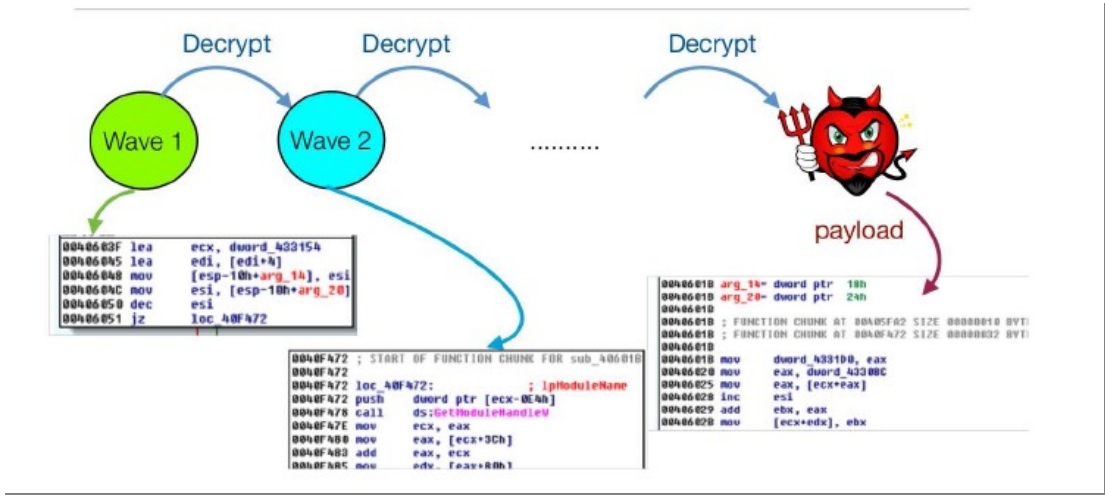
- We are reasoning worst case: seems very
- Still, our attacker plays the rules: respects
 - Can craft very smart input, but only through expected



- What about someone who **really do not play the rules?**
 - Side channel attacks
 - Micro-architectural attacks
 - Fault injections



Another Line of attack : ADVERSARIAL BINARY CODE



address	instr
80483d1	call +5
80483d6	pop edx
80483d7	add edx, 8
80483da	push edx
80483db	ret
80483dc	.byte{invalid}
80483de	[...]

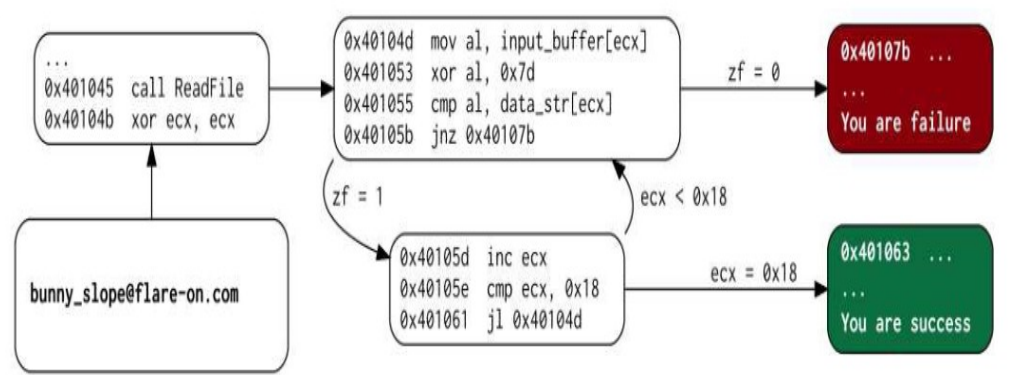


eg: $7y^2 - 1 \neq x^2$
 (for any value of x, y in modular arithmetic)

```

mov  eax, ds:X
mov  ecx, ds:Y
imul ecx, ecx
imul ecx, 7
sub  ecx, 1
imul eax, eax
cmp  ecx, eax
jz   <dead_addr>
    
```

- self-modification
- encryption
- virtualization
- code overlapping
- opaque predicates
- callstack tampering
- ...

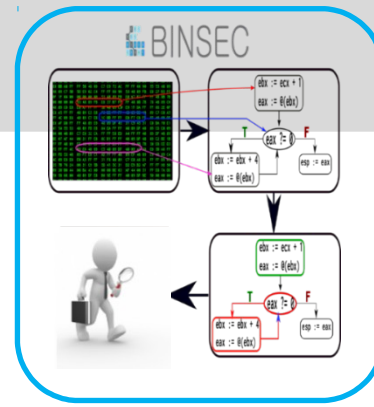


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Break

Prove

Protect



- Explore many input at once
 - Find bugs
 - Prove security
- Multi-architecture support
 - x86, ARM, RISC-V
 - 32bit, 64bit

x86

```
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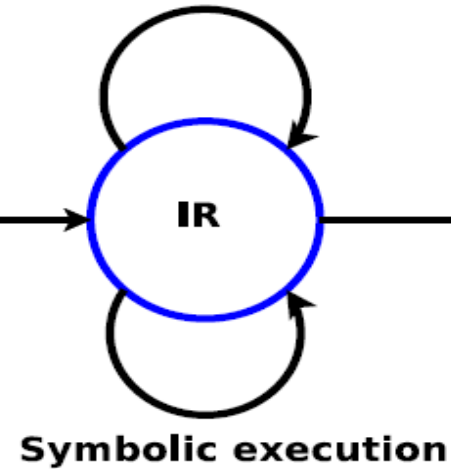
ARM

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```

...

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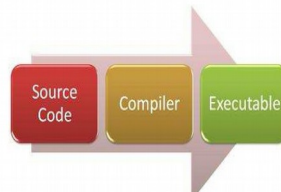
Static analysis



- Advanced reverse
- Vulnerability analysis
- Binary-level security proofs
- Low-level mixt code (C + asm)
- ...



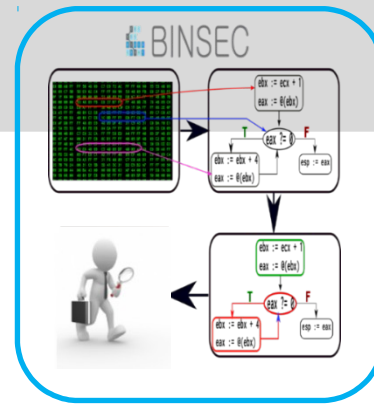
COTS


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ABFFF780BD70696CA101001BDE45
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5A2B4C6D009F5F5D1E0835715697
145FEDBCADACBDAD459700346901
3456KAHA305G67H345BFFADECAD3
00113456735FFD451E13AB080DAD
344252FFAADBDA457345FD780001
FFF22546ADDAE989776600000000
```

...

```
ABFFF780BD70696CA101001BDE45
145634789234ABFFE678ABDCF456
5A2B4C6D009F5F5D1E0835715697
145FEDBCADACBDAD459700346901
3456KAHA305G67H345BFFADECAD3
00113456735FFD451E13AB080DAD
344252FFAADBDA457345FD780001
FFF22546ADDAE989776600000000
```

Static analysis

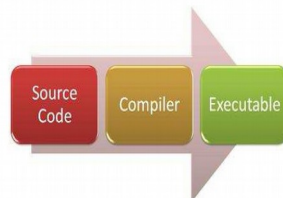
IR

Symbolic execution

- Advanced reverse
- Vulnerability analysis
- Binary-level security proofs
- Low-level mixt code (C + asm)
- ...



COTS


<https://binsec.github.io/>

Binsec intermediate representation

```
inst := lv ← e | goto e | if e then goto e
lv   := var | @[e]n
e    := cst | lv | unop e | binop e e | e ? e : e

unop := ¬ | − | uextn | sextn | extracti..j
binop := arith | bitwise | cmp | concat
arith := + | − | × | udiv | urem | sdiv | srem
bitwise := ∧ | ∨ | ⊕ | shl | shr | sar
cmp := = | ≠ | >u | <u | >s | <s
```

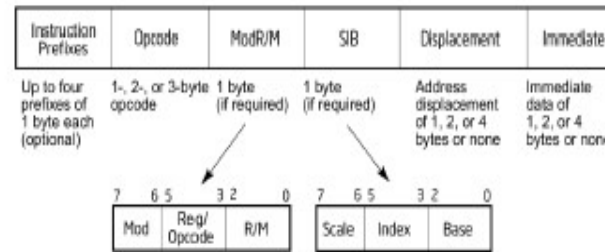
Multi-architecture

x86-32bit – ARMv7

- lhs := rhs
- goto addr, goto expr
- ite(cond)? goto addr

- **Concise**
- **Well-defined**
- **Clear, side-effect free**

INTERMEDIATE REPRESENTATION



- Concise
- Well-defined
- Clear, side-effect free

81 c3 57 1d 00 00 $\xrightarrow{\text{x86reference}}$ ADD EBX 1d57

```
(0x29e,0) tmp := EBX + 7511;
(0x29e,1) OF := (EBX{31,31}=7511{31,31}) && (EBX{31,31}<>tmp{31,31});
(0x29e,2) SF := tmp{31,31};
(0x29e,3) ZF := (tmp = 0);
(0x28e,4) AF := ((extu (EBX{0,7}) 9) + (extu 7511{0,7} 9)){8,8};
(0x29e,6) CF := ((extu EBX 33) + (extu 7511 33)){32,32};
(0x29e,7) EBX := tmp; goto (0x2a4,0)
```


Find real bugs

Bounded verification

Flexible

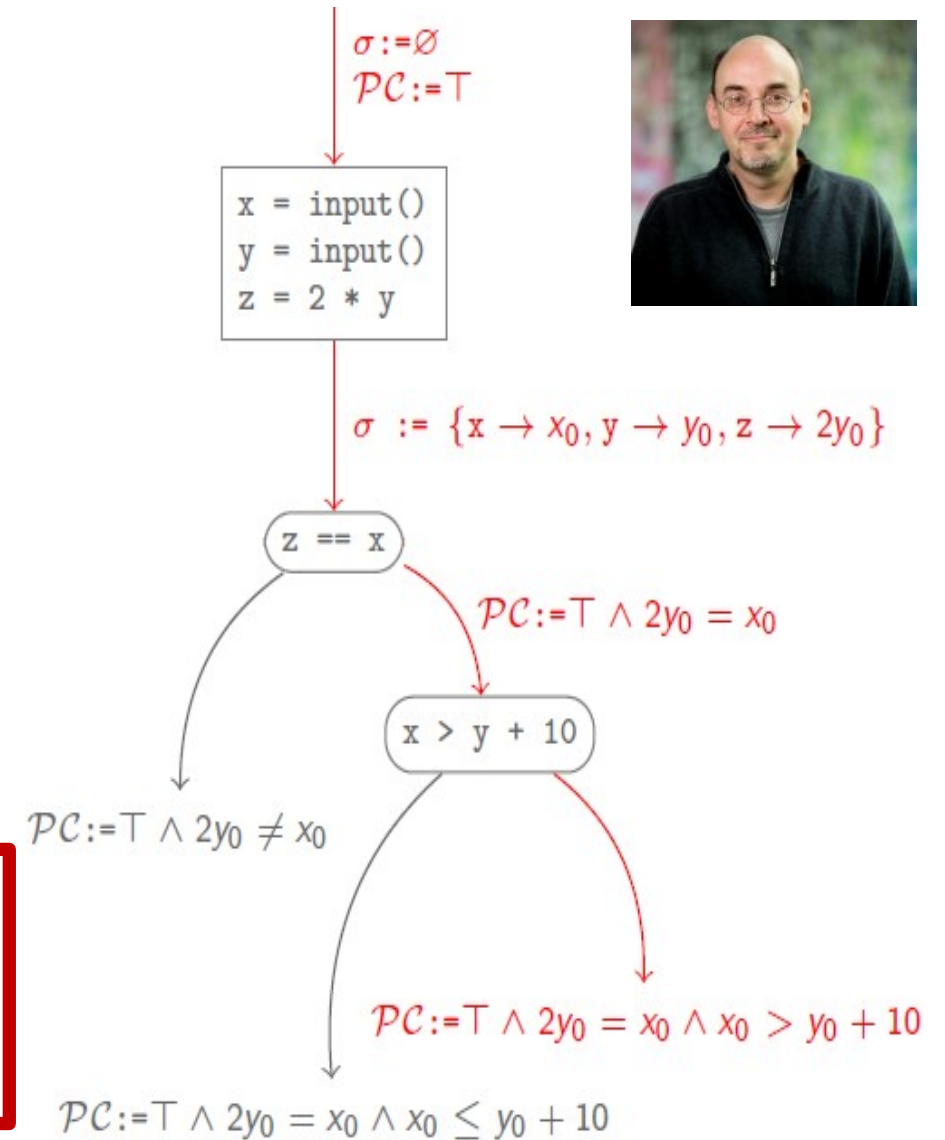
```

int main () {
  int x = input();
  int y = input();
  int z = 2 * y;
  if (z == x) {
    if (x > y + 10)
      failure;
  }
  success;
}

```

Given a path of a program

- Compute its « path predicate » f
- Solution of $f = \text{input}$ following the path
- Solve it with powerful existing solvers



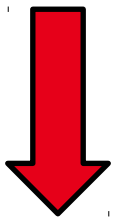
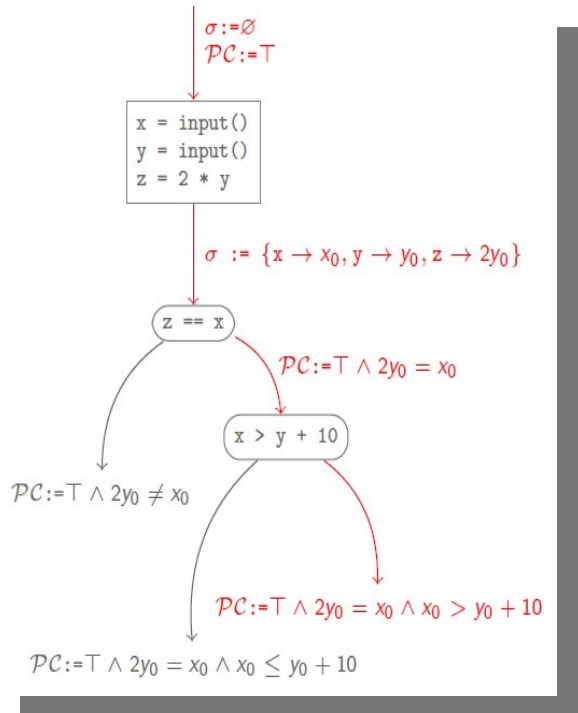
PATH PREDICATE COMPUTATION & SOLVING

Loc	Instruction
0	input(y,z)
1	w := y+1
2	x := w + 3
3	if (x < 2 * z) (branche True)
4	if (x < z) (branche False)

CVC4

Z3

Boolector



let $W_1 \triangleq Y_0 + 1$ in
 let $X_2 \triangleq W_1 + 3$ in
 $X_2 < 2 \times Z_0 \wedge X_2 \geq Z_0$

Blackbox solvers

SMT Solver

my input!!

$Y_0 = 0 \wedge Z_0 = 3$

PATH PREDICATE COMPUTATION & SOLVING

Loc	Instruction
0	input(y,z)
1	w := y+1
2	x := w + 3
3	if (x < 2 * z) (
4	if (x < z) (bran

Key ingredients

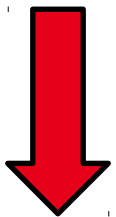
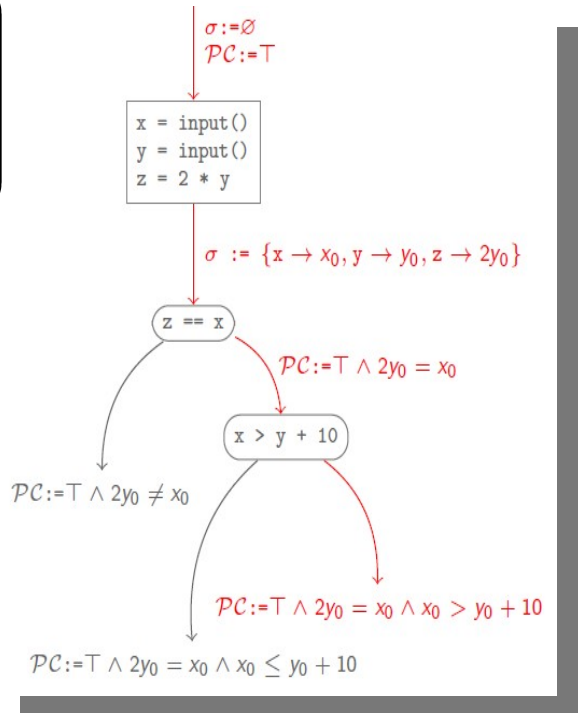
- Path search
- Constraint solving

Beware

- Path explosion
- Constraint solving cost

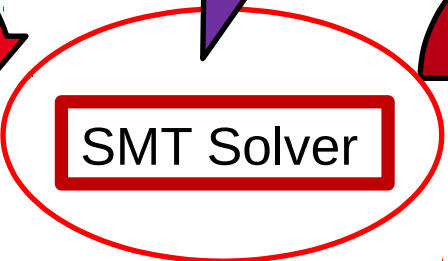
Many optimizations

- Preprocessing, caching, etc.
- Search heuristics, path pruning, merge, etc.
- Concretization



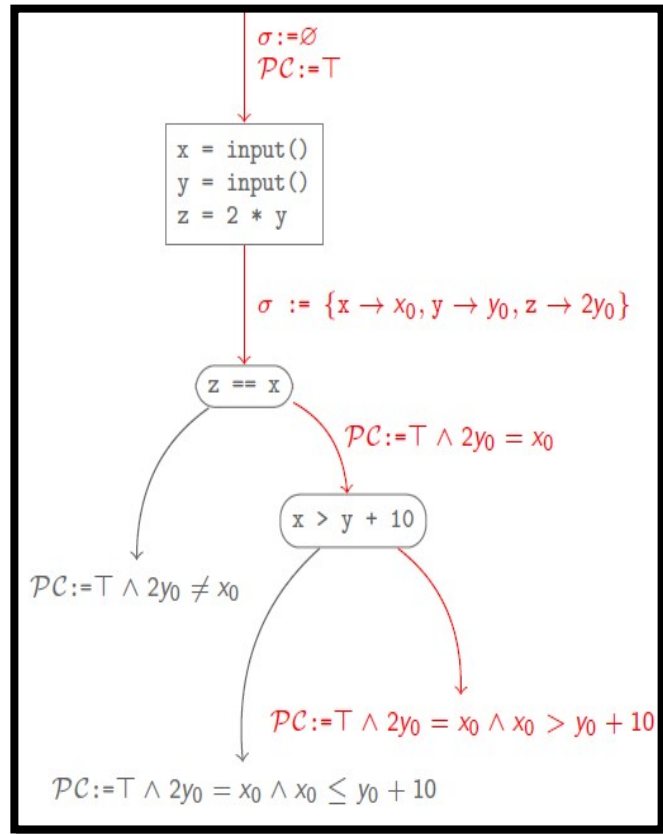
let $W_1 \triangleq Y_0 + 1$ in
 let $X_2 \triangleq W_1 + 3$ in
 $X_2 < 2 \times Z_0 \wedge X_2 \geq Z_0$

Blackbox solvers



my input!!

$Y_0 = 0 \wedge Z_0 = 3$



- ▶ Intensive path exploration
- ▶ Target critical bugs
- ▶ or high coverage
- ▶ From scratch
- ▶ or enhanced prior test suite



Find a needle in the heap!

- **Introduction**
- **Challenges of automated binary-level security analysis**
- **BINSEC & Symbolic Execution for Binary-level Security**
- **Robust reachability and bugs that matter**
- **Adversarial reachability**
- **Conclusion, Take away and Disgression**



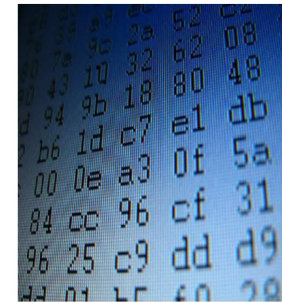
- Problem : not all bugs are equal

<p>Model</p>	<p>Source code</p> <pre>int foo(int x, int y) { int k= x; int c=y; while (c>0) do { k++; c--; } return k; }</pre>
<p>Assembly</p> <pre>_start: load A 100 add B A cmp B 0 jle label label: move @100 B</pre>	<p>Executable</p> <pre>ABFF780BD70696CA1010018DE45 145634789234ABFFE678ABDCF456 5A2B4C60009F5F5D1E0835715697 145FED0CADACB0AD459700346901 3456KAHA30SG67H3458FFADECAD3 00113456735FFD451E13A8080DAD 344232FFAADD0A457345FD780001 FFF22546ADDAE8977660000000</pre>

• Binary code



• Attacker



• Properties

- Reachability-based reasoning may produce **false positive in practice**

```
int main () {  
    int a = input ();  
    int b = input ();  
  
    int x = rand ();  
  
    if (a * x + b > 0) {  
        analyze_me();  
    }  
    else {  
        ...  
    }  
}
```

The problem of « false positive in practice »

- Reachability-based reasoning may produce **false positive in practice**

What?!!

Safety is not security ...

```
int main () {  
    int a = input ();  
    int b = input ();  
  
    int x = rand ();  
  
    if (a * x + b > 0) {  
        analyze_me();  
    }  
    else {  
        ...  
    }  
}
```


- **Reachability-based reasoning** may produce **false positive in practice**

What?!!

Safety is not security ...

- **for example here:**
 - SE will try to solve $a * x + b > 0$
 - May return $a = -100, b = 10, x = 0$
- **Problem: x is not controlled by the user**
 - If x change, possibly not a solution anymore
 - Example: $(a = -100, b = 10, x = 1)$

```
int main () {  
    int a = input ();  
    int b = input ();  
  
    int x = rand ();  
  
    if (a * x + b > 0) {  
        analyze_me();  
    }  
    else {  
        ...  
    }  
}
```

The problem of « false positive in practice »

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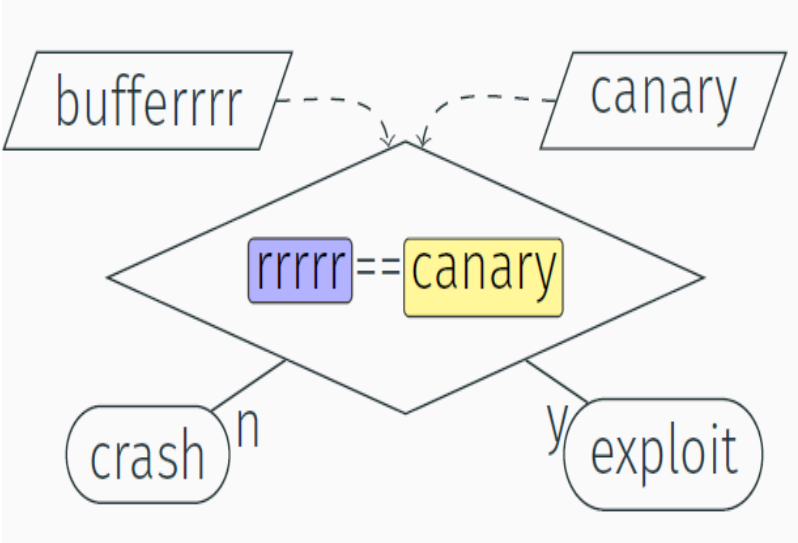
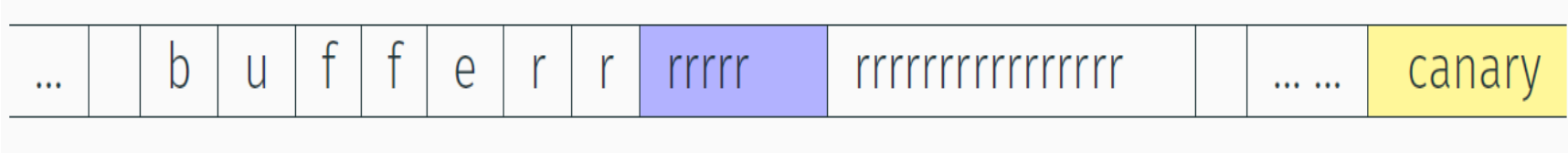
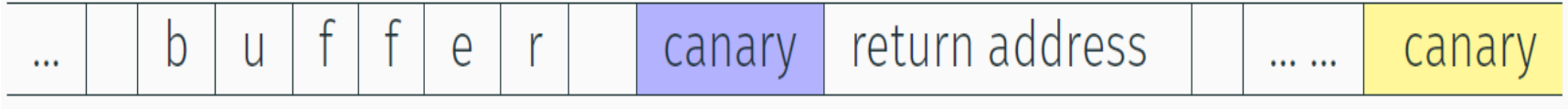
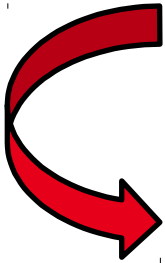
In practice: canaries, secret key in uninitialized memory, etc.

```
int main () {  
    int a = input ();  
    int b = input ();  
  
    int x = rand ();  
  
    if (a * x + b > 0) {  
        analyze_me();  
    }  
    else {  
        ...  
    }  
}
```

Problems with standard reachability?

- Value in blue is checked against canary
- Canary is a parameter

Mitigation: stack canaries



- In practice, only 2^{32} to bypass canary
- Not considered an attack

- Still, Symbolic Execution reports a bug**
- just need `canary == rrrrr`
 - False positive

Problems with standard reachability? (2)

- **Randomization-based protections**
 - Guess the randomness
- **Bugs involving uninitialized memory**
 - Guess memory content
- **Undefined behaviours**
 - Exist also in hardware
- **Stubbing functions (I/O, opaque, crypto, ...)**
 - Guess the hash result ...
- **Underspecified initial state**



Real life false positives

Formally reachable, but
in reality, cannot be triggered reliably

Our proposal [CAV 2018, CAV 2021, FMSD 2022]

Choose a threat Model

Partition input into controlled input a and uncontrolled input x

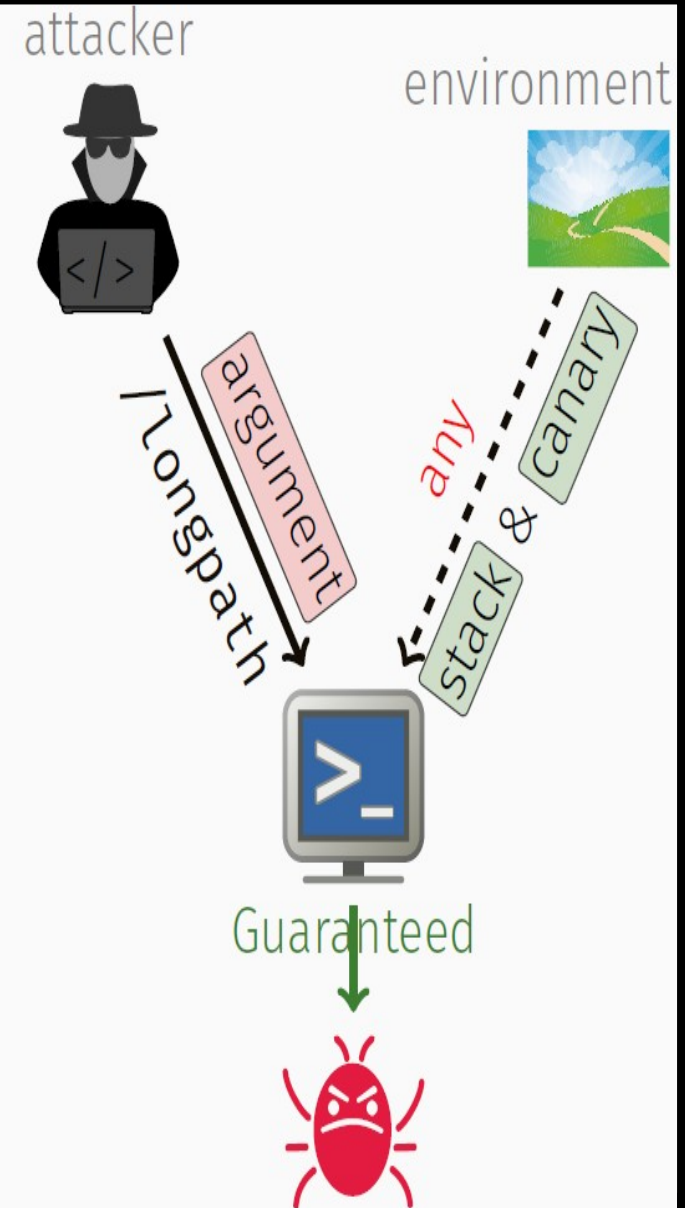
$(a, x) \vdash \ell$ means “with inputs a and x , the program executes code at ℓ ”

Reachability of location ℓ

$$\exists a, x. (a, x) \vdash \ell$$

Robust Reachability of ℓ

$$\exists a. \forall x. (a, x) \vdash \ell$$



Path merging

Optional in SE

Required for completeness in Robust SE

...and a few other differences


assume ψ : $\exists a.\forall x.\psi \Rightarrow \phi$ instead of $\exists a.\forall x.\psi \wedge \phi$

path pruning: no extra quantifier

concretization: only works on controlled values

$$\exists a.\forall x.\phi \xrightarrow[\substack{\text{concretize} \\ X \text{ to } 90}]{\text{concretize}} \exists a.\forall x.\underbrace{x = 90 \wedge \phi}$$

Proof-of-concept implementation

- A binary-level Robust SE and Robust BMC engine based on  BINSEC
- Discharges quantified SMT(arrays+bitvectors) formulas to Z3
- Evaluated against 46 reachability problems including CVE replays and CTFs

	BMC	SE	RBMC	RSE	RSE+ ^{path merging}
Correct	22	30	32	37	44
False positive	14	16			
Inconclusive			1	7	
Resource exhaustion	10		13	2	2

Robust variants of SE and BMC

No false positives, more time-outs/memory-outs, 15% median slowdown

Case-studies: 4 CVE

CVE-2019-14192 in U-boot (remote DoS: unbounded memcpy) Robustly reachable

CVE-2019-19307 in Mongoose (remote DoS: infinite loop) Robustly reachable

CVE-2019-20839 in libvncserver (local exploit: stack buffer overflow)

Without stack canaries: Robustly reachable

With stack canaries: Timeout

CVE-2019-19307 in Doas (local privilege escalation: use of uninitialized memory)

Doas = OpenBSD's equivalent of sudo

Depends on the configuration file `/etc/doas.conf`

Use robust reachability in a more creative way

Reinterpret “controlled input” differently:

the **attacker** controls nothing, only executes

the **sysadmin** controls the configuration file: **controlled input**

the **environment** sets initial memory content etc: **uncontrolled inputs**

Versatility of Robust Reachability

“Controlled inputs” are not limited to
“controlled by the attacker”

The meaning of robust reachability here

Are there configuration files which make the attacker win all the time?

Yes: for example typo “`permit ww`” instead of “`permit www`”

Alternative formalism: non-interference

Behavior does not depend on x Implies reachability

Non Interference

for all a

no

Robust reachability

for a single a

yes

Non-interference + Reachability \Rightarrow Robust Reachability
#

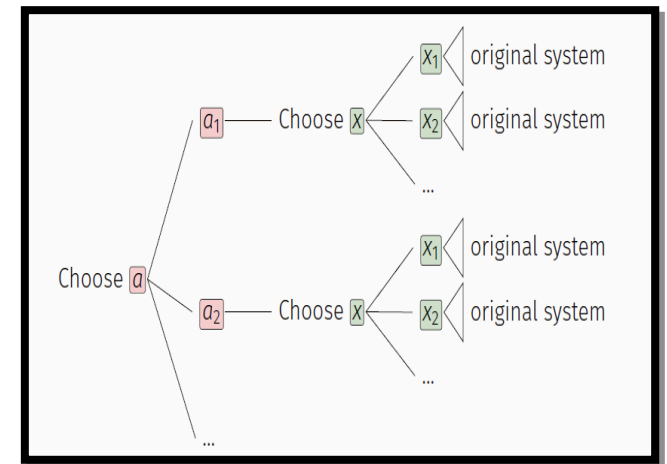
Alternative formalisms (2)

As a hyperproperty, robust reachability is pure hyperliveness

- not a trace property (most studied case)
- not (k -)hypersafety (\Rightarrow not solvable with self-composition)

Temporal logics: Expressible in CTL, HyperLTL, but no provers for generic programming languages

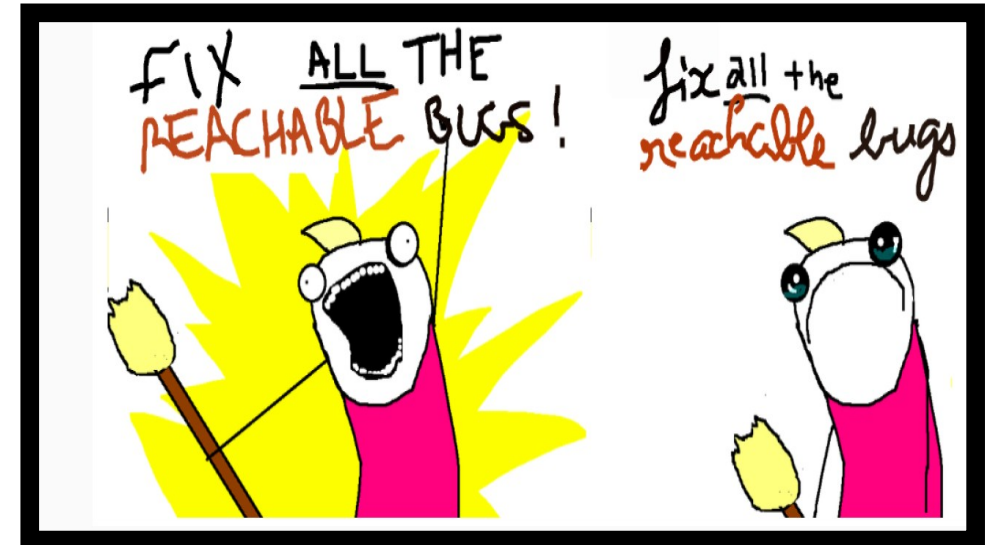
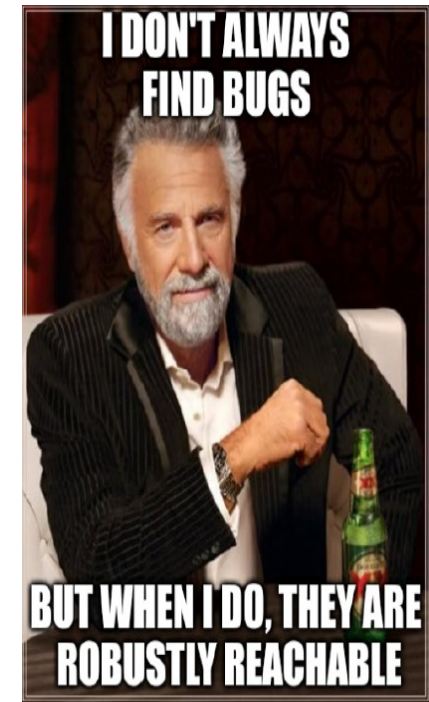
Need a dedicated proof method!



- **Robust reachability draws a line between some good bugs and bad bugs**
 - Based on replicability
- **Several formalisms can express robust reachability** [games, ATL, hyperLTL, CTL]
 - Yet no efficient software-level checkers
- **A few prior attempts, on different dimensions**
 - Quantitative or probabilistic approaches (model checking, non interference)
 - Automated Exploit Generation (Avgerinos et al., 2014)
 - Test Flakiness (O'Hearn, 2019) [a specific case of robust reachability]
 - Fair model checking (Hart et al., 1983)
- **Qualitative « all or nothing » robust reachability may be too strong**
 - Mitigation : add user-defined constraints over the uncontrolled variables
 - WIP : quantitative definitions, inference of robustness conditions

Potential applications

- **Better testing / bug finding tools**
 - Ex: find replicable bugs
 - Ex: generate non-flaky tests
- **Test suite evaluation**
 - Are the test case replicable?
- **Bug prioritisation**
 - Replicable bugs first



Idea : reduce quantified formula to the quantifier-free case

- Approximation
- But reuse the whole SMT machinery

Key insights:

- independence conditions
- formula strengthening

- Quantified reachability condition

① $\forall x. ax + b > 0$

- Taint variable constraint

② $a^* \wedge b^* \wedge \neg x^*$ (a^*, b^*, x^* : fresh boolean variables)

- Independence condition

③ $((a^* \wedge x^*) \vee (a^* \wedge a = 0) \vee (x^* \wedge x = 0)) \wedge b^*$

④ $((\top \wedge \perp) \vee (\top \wedge a = 0) \vee (\perp \wedge x = 0)) \wedge \top$

⑤ $a = 0$

- Quantifier-free reachability condition

⑥ $(ax + b > 0) \wedge (a = 0)$

- **Introduction**
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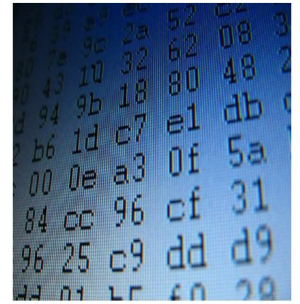
- Problem : what about the attacker capabilities ?

<p>Model</p>	<p>Source code</p> <pre>int foo(int x, int y) { int k= x; int c=y; while (c>0) do { k++; c--; } return k; }</pre>
<p>Assembly</p> <pre>_start: load A 100 add B A cmp B 0 jle label label: move @100 B</pre>	<p>Executable</p> <pre>ABFF780BD70696CA1010018DE45 145634789234ABFFE678ABDCF456 5A2B4C60009F5F5D1E0835715697 145FEDBCADACBBDAD459700346901 3456KAHA305G67H3458FFADECAD3 00113456735FFD451E13A8080DAD 344232FFAADD0A457345FD780001 FFF22546ADDAE8977660000000</pre>

• Binary code

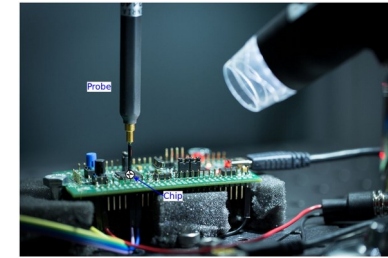
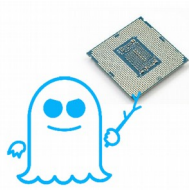


• Attacker



• Properties

Context



- Many techniques and tools for security evaluations.
- Usually consider a weak attacker, able de **craft smart inputs**.
- Real-world attackers are more powerful: various attack vectors + multiple actions** in one attack.

Hardware attacks

Electromagnetic pulses

Power glitch

Clock glitch

Laser beam

Faultline

DVFS

Race condition

Load Value Injection

Spectre

Rowhammer

Software-implemented hardware attacks

Micro-architectural attacks

Man-At-The-End attacks

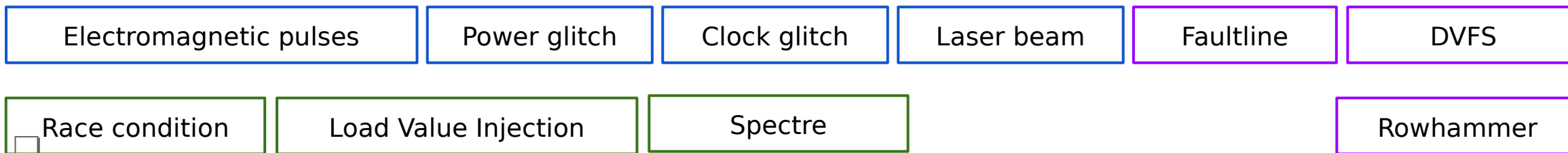
Context

- How to deal with that ?
- principled
- efficient

- Many techniques and tools for security evaluations.
- Usually consider a weak attacker, able de **craft smart inputs**.
- Real-world attackers are more powerful: various attack vectors + multiple actions** in one attack.

Hardware attacks

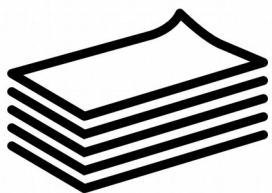
Software-implemented hardware attacks



Micro-architectural attacks

Man-At-The-End attacks

State-of-the-Art: software-implemented fault injection



Mutant generation: create a new mutated program for each fault configuration.

k (faults) among n (lines) mutant generated



Forking technique: fork the analysis with a fault at each possible fault location.

k (faults) among n (lines) paths created

- Both faces scalability issues (path explosion) hindering multi-fault analysis.
- They don't provide formalization of the underlying problem.

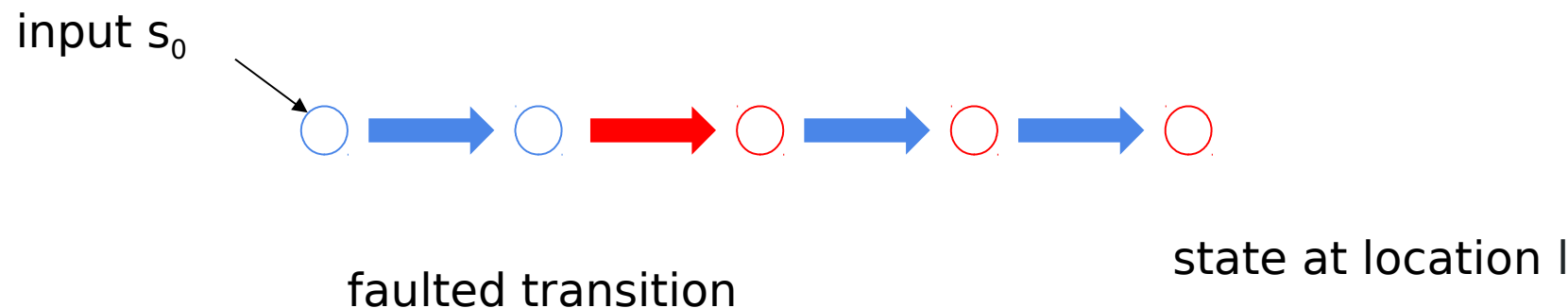
Contributions

- We formalize the **Adversarial Reachability** problem
- We propose **Adversarial Symbolic Execution**, with dedicated **optimizations**.
- We propose an **implementation** and **evaluation** of our technique.
- We perform a security analysis of the **WooKey bootloader**.

Adversarial reachability

Goal: have a formalism extending standard reachability to reason about a program execution in presence of an advanced attacker.

Adversarial reachability: A location l is adversarially reachable in a program P for an attacker model A if $S_0 \mapsto^* l$, where \mapsto^* is a succession of program instructions interleaved with faulty transitions.



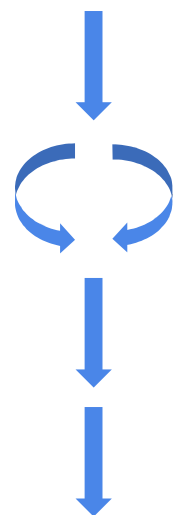
Forking encodings

Original



$x := y$

Forking



$x := y$

Non deterministic choice
between fault or normal
if $nb_f < \max_f$

$x := \text{fault}_i$
 $nb_f ++$

- Covers all adversarial behaviors
- Number of path exponential with #
fault injection points

Forkless encodings and FASE

Original



$x := y$

Forkless



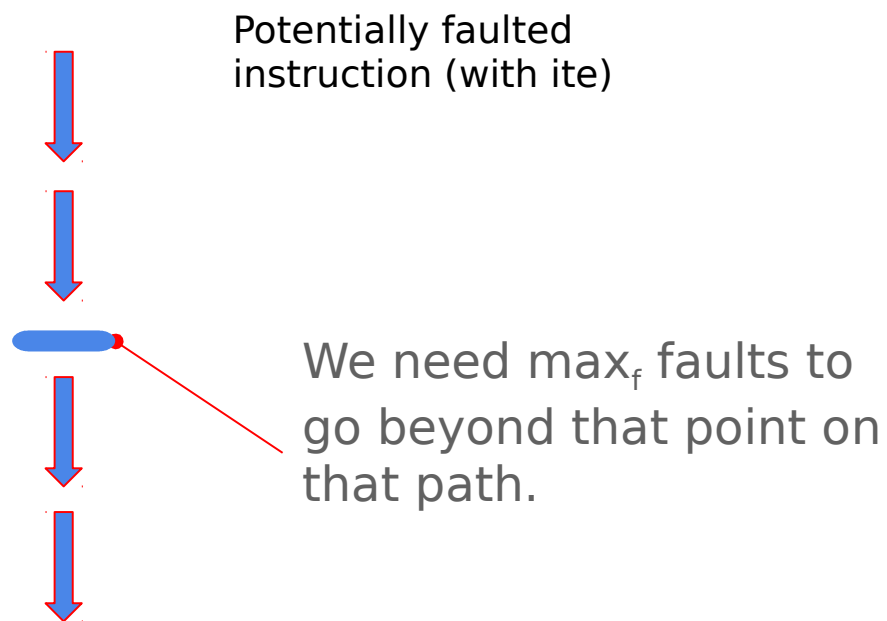
$x := \text{ite } \text{here}_i ? \text{fault}_i : y$

$\text{here}_i \in [0,1], \Sigma \text{ here}_i \leq \max_f$

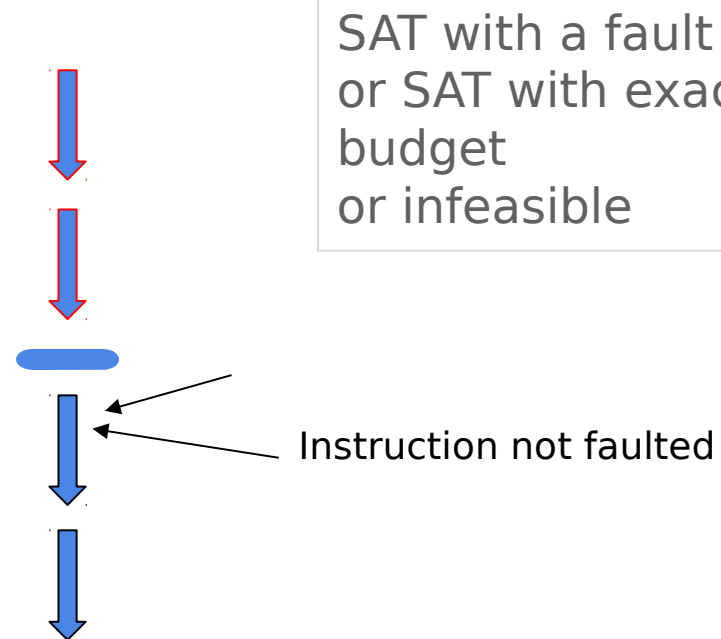
- Covers all adversarial behaviors
- Only 1 path**
- More complex formulas**

Early Detection of fault Saturation (EDS)

FASE



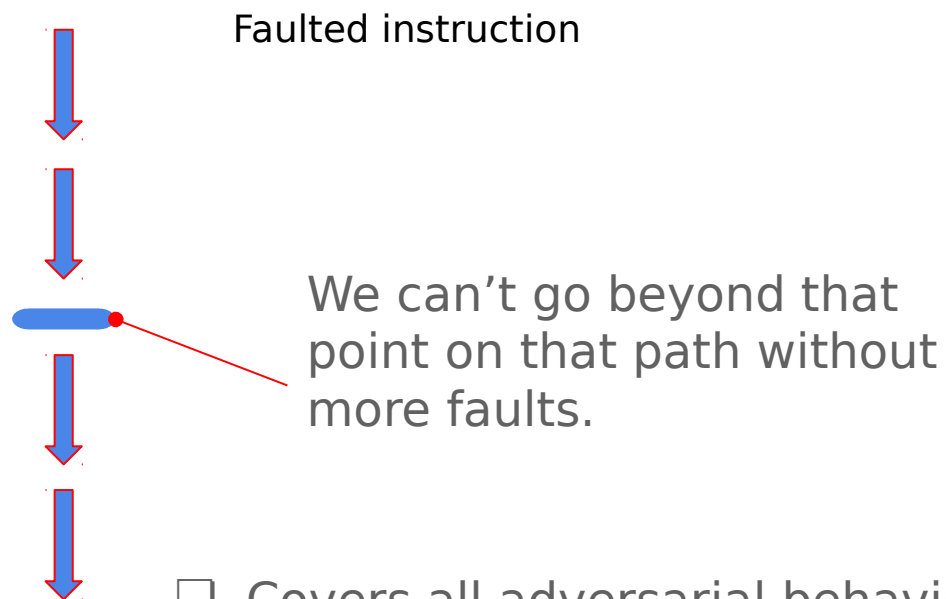
FASE-EDS



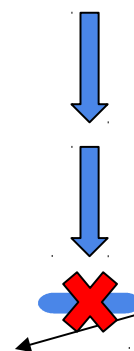
- Covers all adversarial behaviors, as complete as FASE
- Only 1 path
- Reduce number of fault injections along a path

Injection On Demand (IOD)

FASE



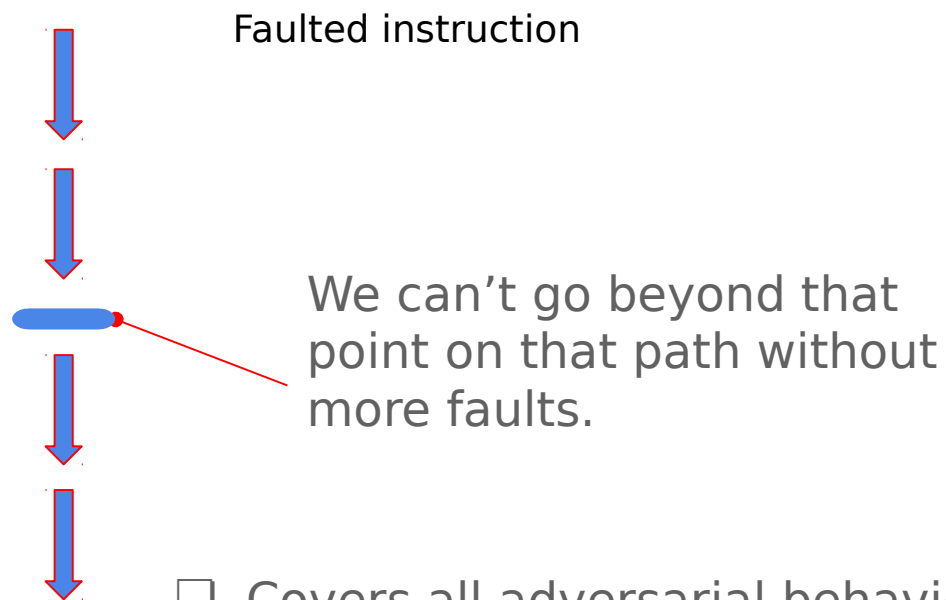
FASE-IOD



- Covers all adversarial behaviors, as complete as FASE
- Only 1 path
- Reduce number of fault injections
- Additional queries

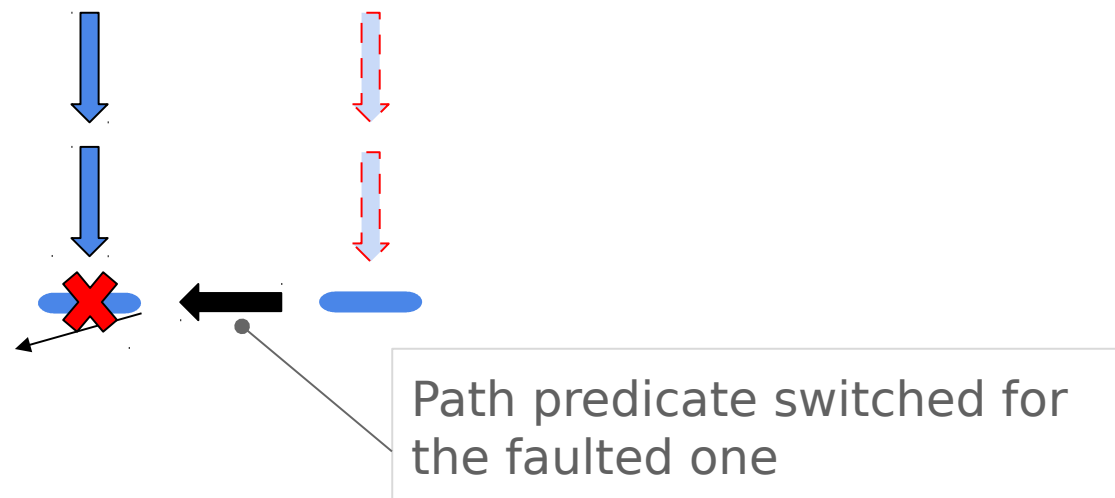
Injection On Demand (IOD)

FASE



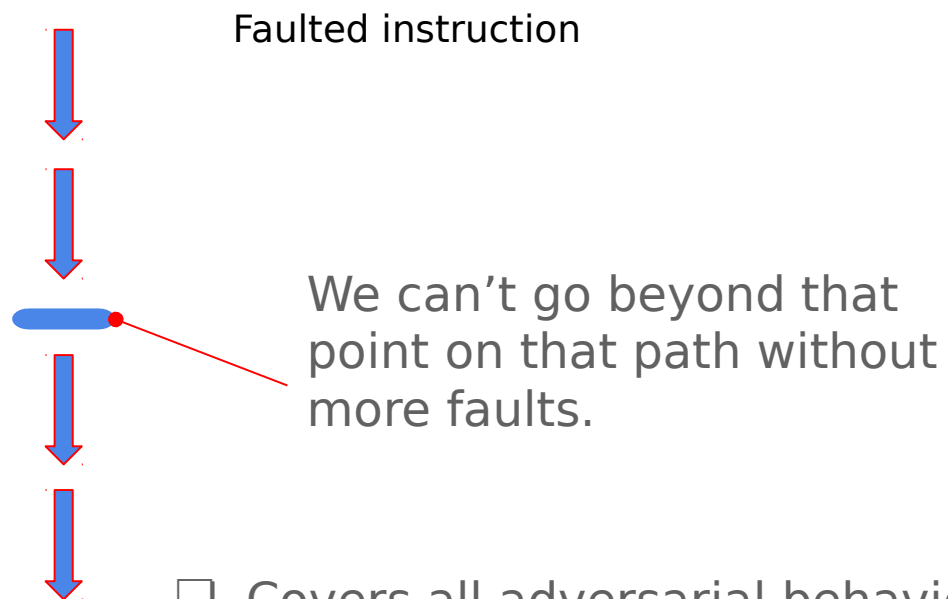
- Covers all adversarial behaviors, as complete as FASE
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FASE-IOD

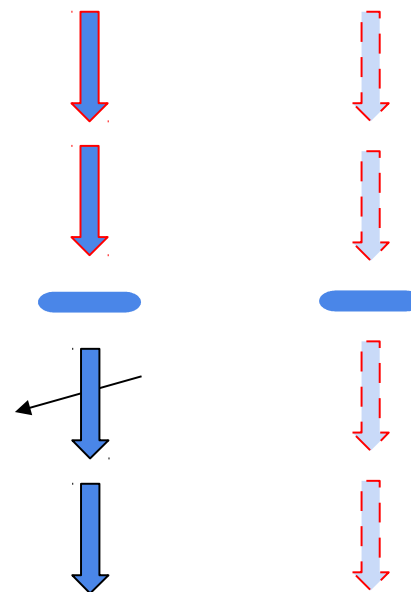


Injection On Demand (IOD)

FASE



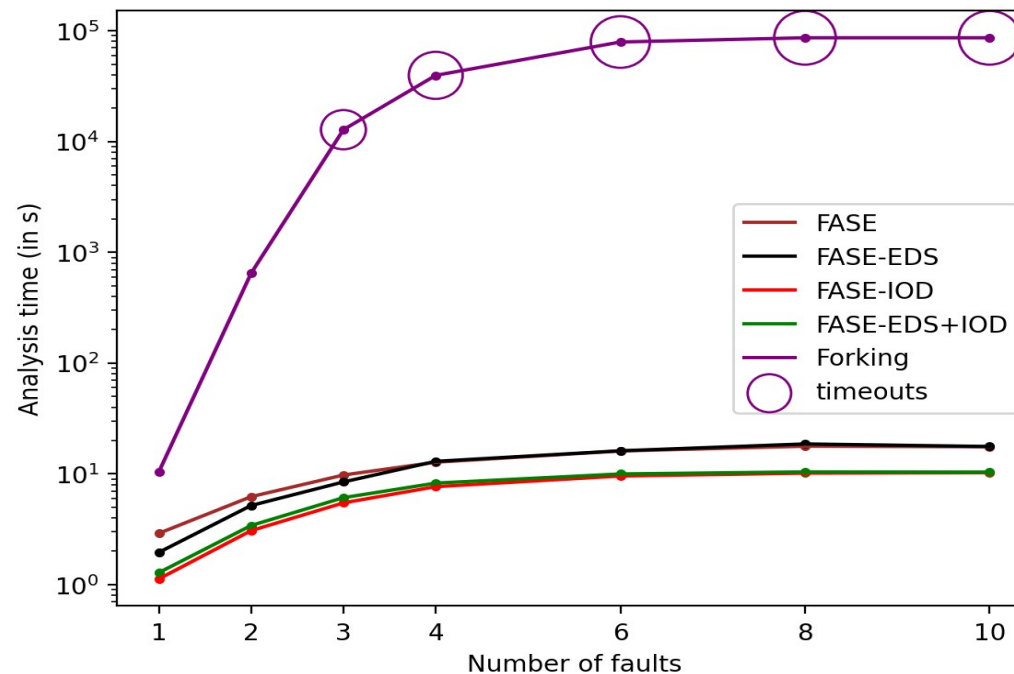
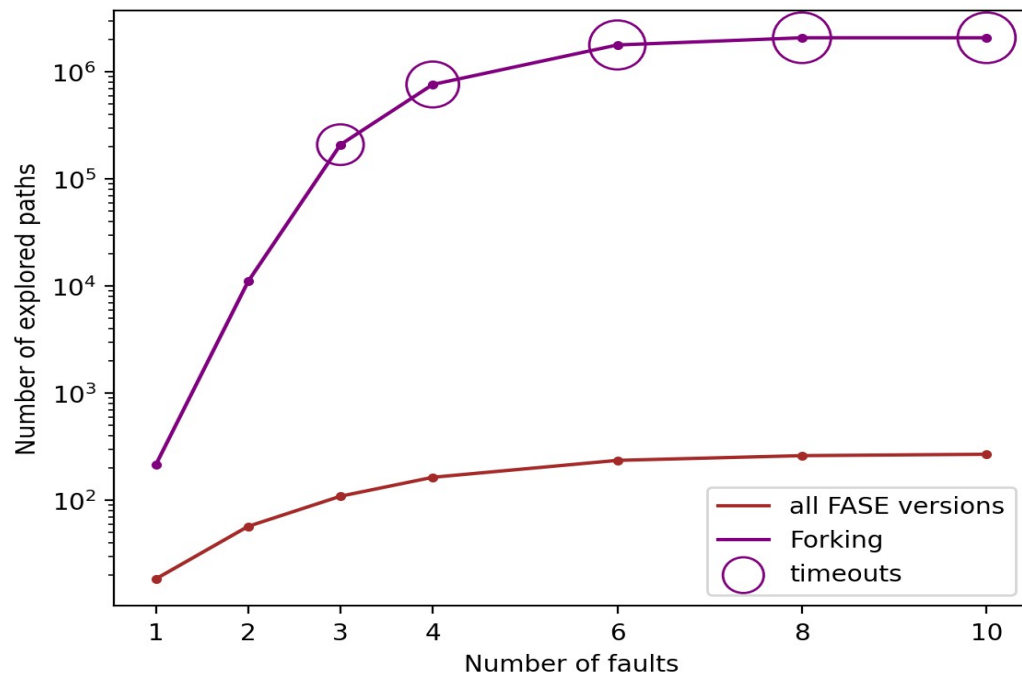
FASE-IOD



Bonus: under-approximation of nb_f

- Covers all adversarial behaviors, as complete as FASE
- Only 1 path
- Reduce number of fault injections
- Additional queries

RQ2 - scaling without path explosion



→ Forking explodes in explored paths while FASE doesn't.
 → Translates to improved analysis time overall.

Security scenarios using different fault models

CRT-RSA: [1]

- basic vulnerable to 1 reset → OK
- Shamir (vulnerable) and Aumuler (resistant) → TO

Secret-keeping machine: [2]

- Linked-list implementation vulnerable to 1 bit-flip in memory → OK
- Array implementation resistant to 1 bit-flip in memory → OK
- Array implementation vulnerable to 1 bit-flip in registers → OK

Secswift countermeasure: llvm-level CFI protection by STMicroelectronics [3]

- SecSwift implementation [4] applied to VerifyPIN_0 → early loop exit attack with 1 arbitrary data fault or test inversion in valid CFG

[1] Puys, M., Riviere, L., Bringer, J., Le, T.h.: High-level simulation for multiple fault injection evaluation. In: Data Privacy Management, Autonomous Spontaneous Security, and Security Assurance. Springer (2014)

[2] Dullien, T.: Weird machines, exploitability, and provable unexploitability. IEEE Transactions on Emerging Topics in Computing (2017)

[3] de Ferrière, F.: Software countermeasures in the llvm risc-v compiler (2021), <https://open-src-soc.org/2021-03/media/slides/3rd-RISC-V-Meeting-2021-03-30-15h00-Fran%C3%A7ois-de-Ferri%C3%A8re.pdf>

[4] Lacombe, G., Feliot, D., Boespflug, E., Potet, M.L.: Combining static analysis and dynamic symbolic execution in a toolchain to detect fault injection vulnerabilities. In: PROOFS WORKSHOP (SECURITY PROOFS FOR EMBEDDED SYSTEMS) (2021)

Case study

WooKey bootloader: secure data storage by ANSSI, 3.2k loc.

Goals:

1. Find known attacks (from source-level analysis)
 - a. Boot on the old firmware instead for the newest one [1]
 - b. A buffer overflow triggered by fault injection [1]
 - c. An incorrectly implemented countermeasure protecting against one test inversion [2]

2. Evaluate countermeasures from [1]
 - a. Evaluate original code → **We found an attack not mentioned before**
 - b. Evaluate existing protection scheme [1] **(not enough)**
 - c. **Propose and evaluate our own protection scheme**



[1] Lacombe, G., Feliot, D., Boespflug, E., Potet, M.L.: Combining static analysis and dynamic symbolic execution in a toolchain to detect fault injection vulnerabilities. In: PROOFS WORKSHOP (SECURITY PROOFS FOR EMBEDDED SYSTEMS) (2021)

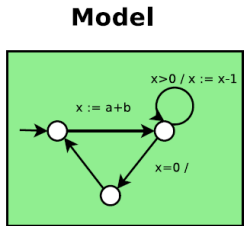
[2] Martin, T., Kosmatov, N., Prevosto, V.: Verifying redundant-check based countermeasures: a case study. In: Proceedings of the 37th ACM/SIGAPP Symposium on Applied Computing. (2022)

- Adversarial reachability takes an active attacker into account
- Well known in cryptographic protocol verification, not for code
- generic: reachability, hyper-reachability, non termination
- Scalability ?
- Which capabilities for the attacker? [link with Hardware security community]
- Strong link with robust reachability

- **Introduction**
- **Challenges of automated binary-level security analysis**
- **BINSEC & Symbolic Execution for Binary-level Security**
- **Robust reachability and bugs that matter**
- **Adversarial reachability**
- **Conclusion, Take away and Disgression**

TAKE AWAY: SECURITY IS NOT SAFETY

- Fun for FM/PL researchers
- Important applications



Assembly

```

_start:
load A 100
add B A
cmp B 0
jle label

label:
move @100 B
    
```

Source code

```

int foo(int x, int y) {
int k= x;
int c=y;
while (c>0) {
k++;
c--;}
return k;
}
    
```

• Binary code

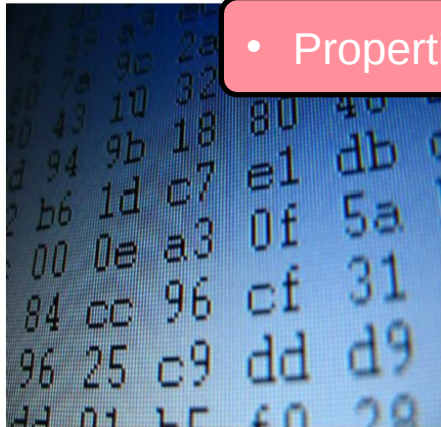
• Attacker



Executable

```

ABFFF780BD70696CA1010018DE45
145634789234ABFFE678ABDCF456
5A2B4C6D009F5F5D1E0835715697
145FEDBCADACBDAD459700346901
3456KAHA305G67H345BFFADECAD3
00113456735FFD451E13AB080DAD
344252FFAADBDA457345FD780001
FFF22546ADDAE989776600000000
    
```



• Properties

- Reachability is well suited for safety, yet
- security leads to many new interesting variations
- Still many things to do !!
- Symbolic Execution appears to be versatile enough
- BINSEC is open source, check it [with us]

<https://binsec.github.io/>

• Looking for postdoc & PhD

THANK YOU