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## Defeating MBA-based Obfuscation





Prelude

# **Q**b

```
def foo(x):
    v0 = (x*0xE5 + 0xF7)
    v3 = (((v0*0x26)+0x55)&0xFE)+(v0*0xED)+0xD6)
    v4 = (((((( ( ( v3*0x2))+0xFF)&0xFE)+v3)*0x03)+0x4D)
    v5 = (((((v4*0x56)+0x24)&0x46)*0x4B)+(v4*0xE7)+0x76)
    v7 = ((((v5*0x3A)+0xAF)&0xF4)+(v5*0x63)+0x2E)
    v6 = (v7&0x94)
    v8 = ((((v6+v6+(-(v7&0xFF)))*0x67)+0xD))
    result = ((v8*0x2D)+(((v8*0xAE)|0x22)*0xE5)+0xC2)
    result = (0xed*(result-0xF7))&0xFF
    return result
```

Prelude

# Q<sup>b</sup>

```
def foo(x):
    return ((x ^ 0x5C) & 0xFF)
```

### Introduction

- ▶ Data-flow obfuscation with *mixed* expressions
- ▶ Defining a notion of *simplification* is an issue
- Assessing the resilience of the MBA obfuscation

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MBA Obfuscation Expression Simplification

Utility of MBA in Obfuscation

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### **Definition**

#### Mixed Boolean-Arithmetic expression

An expression mixing arithmetic operators  $(+, -, \times)$  and bitwise/boolean operators  $(\land, \lor, \oplus, \neg)$ .

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- ► Already exists in cryptography (without the name)
- ▶ Defined in *Information Hiding in Software with Mixed Boolean-Arithmetic* [Zhou et al. 2007]

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An expression mixing arithmetic operators  $(+, -, \times)$  and bitwise/boolean operators  $(\land, \lor, \oplus, \neg)$ .

#### Example

$$f(x,y) = (x \oplus y) + 2 \times (x \wedge y)$$

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NB: 
$$f(x, y) = x + y$$

#### **Expression Obfuscation**

- ▶ **Rewritings**:  $x + y \rightarrow (x \oplus y) + 2 \times (x \land y)$
- ▶ **Encodings**:  $x \to 237 \times (229x + 247) + 85$  (on 8 bits)
- ► Those two steps are applied iteratively

```
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- Obfuscation is designed to counter human and automatic analysis
- ▶ We need to assess the simplicity of MBA expressions specifically
- ► The notion of simplicity can also depend on the simplification algorithm

# Arithmetic Simplification

The expanded form is canonical, but not always the most readable.

$$(x-3)^2 - x^2 + 7x - 7 = x + 2$$
  
 $(1+x)^{100} = 1 + 100x + \dots + 100x^{99} + x^{100}$ 

Most computer algebra software provide different forms.

# **Boolean Simplification**

Several canonical forms available: CNF, DNF, ANF...

#### Circuit simplification

#### Can reduce:

- ▶ the number of gates
- the depth of the circuit
- ▶ the fan-out of the gates
- **...**

#### Example:

$$(A \wedge B) \vee (B \wedge C \wedge (B \vee C))$$

CNF:  $(B \land (A \lor C))$ 

DNF:  $((A \land B) \lor (B \land C))$ 

# Mixed Simplification

Attacks on the MBA obfuscation for **opaque constants** in *Effectiveness of Synthesis in Concolic Deobfuscation* [Biondi et al. 2015]:

- approach using SMT solvers
- algebraic simplification technique
- drill-and-join synthesis method

All these attacks are very dependent on the obfuscation technique, which is different for constant and operator obfuscation.

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We focus on the expression obfuscation.

# Q<sup>b</sup>

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Background

Utility of MBA in Obfuscation First Issues Analysis difficulties

Our Contribution: MBA Simplification

Conclusion

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### First Issues

- Incompatibility of operators: no general rules for mixed expressions
- Compiler optimisations are inefficient
- Symbolic computation software rarely support bitwise operators
- SMT solvers often implement bit-vector logic, but goals differ

## Analysis Difficulties

#### Reverse engineering context

- Compilation: the obfuscation very probably occurred during compilation, optimisation passes may have been applied
- Extraction: a method is needed to obtain an expression from the assembly language (e.g. symbolic execution)

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## **Expression Representation**

#### Term graph representation: acyclic graph

- leaves are constant numbers or variables, other nodes are operators
- ▶ an edge from o to e means e is an operand of operator o
- ▶ there is only one root node
- common expressions are shared

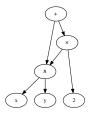


Figure : Term graph for the expression  $2 \times (x \wedge y) + (x \wedge y)$ .

## Sharing of Subgraphs

#### def foo(x):

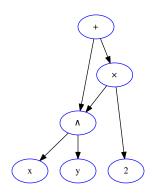
+ (((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) & 70) \* 75) + (((((((-(((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) & 70) \* 75) + (((((((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 231)) + 118) \* 58) + 175) & 244) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) & 70) \* 75) + (((((((-((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 231)) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) - (((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) +(((x\*229)+247)\*237))+214))\*3)+77)\*86)+36)&70)\*75)+((((((((((x\*229)+247)\*38)+85)&254)+(((x\*229)+247))\*38)))\*254)+((((x\*229)+247))\*38))\*254)+(((((x\*229)+247))\*38))\*254))\*274)\* 237)) + 214) \* 2)) + 255) & 254) + (((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 231)) + 118) \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) & 70) \* 75) + ((((((-(((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) + 21) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) & 70) \* 75) + (((((((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + (((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 231)) + 118) \* 99)) + 46) & 148)) + 247) \* 38) + 85) \* 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) \* 70) \* 75) + ((((((-(((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + (((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) \$ 254) + (((((((x \* 229) + 247) \* 38) + 85) \$ 254) + (((x \* 229) + 247) \* 237)) + 214)) \* 3) + 77) \* 86) + 36) \$ 70) \* 75) + (((((((-(((((((x \* 229) + 247) \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 237)) + 214) \* 2)) + 255) & 254) + ((((((x \* 229) + 247) \* 38) + 85) & 254) + (((x \* 229) + 247) \* 38)) + 247) \* 237)) + 214)) \* 3) + 77) \* 231)) + 118) \* 99)) + 46) & 255))) \* 103) + 13) \* 174) | 34) \* 229)) + 194) - 247)) & 255)

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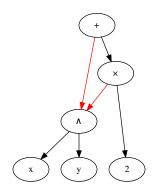
# Simplicity Metrics (1)

**Number of nodes:** reducing the size improves the readability and makes it easier to manipulate for any software.



# Simplicity Metrics (2)

**MBA** alternance: number of edges linking two operators of different types (arithmetic or boolean).



#### Step one: MBA rewriting

Invert the rewriting process of the obfuscation. For example:

$$(x \oplus y) + 2 \times (x \wedge y) + 2 \times (x \wedge y)$$
$$(x \oplus y) + 2 \times (x \wedge y) \to x + y$$

#### Step two: arithmetic simplification

Use existing arithmetic simplification techniques. For example, on 8 bits:

$$237 \times (229x + 247) + 85 = x$$

Q<sup>b</sup>

pattern matching expansion
$$(2 \times (x \lor 0x5c) - (x \oplus 0x5c)) \times 0x2 = (x + 0x5c) \times 0x2$$

$$= 2x + 0x5c$$



pattern matching expansion
$$(2 \times (x \vee 0x5c) - (x \oplus 0x5c)) \times 0x2 = (x + 0x5c) \times 0x2$$

$$= 2x + 0xb8$$

$$2 \times (x \vee 0x5c) - (x \oplus 0x5c) = 2 \times (x \vee 0x5c) + (\neg(x \oplus 0x5c)) + 1$$

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#### Issues

- ▶ Obfuscation patterns must be known
- Detection of patterns is not trivial
- ▶ Properties of the set of rules: termination, confluence, convergence...

## Symbolic Simplification with PAttern Matching (SSPAM)

- Implemented in Python, working with the ast module
- Contains its own pattern matcher
- Arithmetic simplification handled by the sympy module

#### Flexible matching

Query the SMT solver Z3 to prove equivalence of patterns. For example, if the known pattern is  $2 \times (x \vee y) - (x \oplus y)$ :

```
1  x = z3.BitVec('x', 8)
2  pattern = 2*(x | 0x5c) - (x ^ 0x5c)
3  expr = (2*x | 0xb8) + (x ^ 0xa3) + 1
4  z3.prove(pattern == expr)
```

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▶ Simplifies all public examples of MBA obfuscated expressions

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- Evaluated on our own obfuscated samples:
  - On different expressions: (x + y),  $(x \oplus y)$ ,  $(x \wedge 78)$ ,  $(x \wedge 12)$
  - 50 obfuscated samples per expression
  - One pattern to rewrite each operator:  $+, \oplus, \wedge, \vee$

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  - 50 obfuscated samples per expression
  - One pattern to rewrite each operator:  $+, \oplus, \wedge, \vee$
- Size of nodes reduced by approximatively 50%
- ► For two steps of obfuscation, around half of the expressions are *fully simplified*



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### Conclusion

- Definition of simplicity is not trivial
- Provided metrics to help characterize it
- ▶ Implemented an algorithm to simplify MBA obfuscated expressions

#### Future work

- Definition of simplicity applied to MBA expressions
- ► Bit-vector size metric
- Properties of the set of rewrite rules
- ▶ Improving SSPAM (strategies, bitwise simplification...)

## Thank you!

https://github.com/quarkslab/sspam/



## Improving MBA-based Obfuscation

- **Expression-specific patterns:** obfuscate (x + 3) instead of (x + y)
- ► Conditionnal rewritings: equivalence for a certain range on variables
- More complex encodings: permutation polynomials modulo  $2^n$