# Identifying Input-Dependent Jumps from Obfuscated Execution using Dynamic Data Flow Graphs

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#### Introduction

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Obfuscation

- Semantics-preserving program transformation
- Makes analysis difficult both for humans and machines
- Useful when you cannot trust man-at-the-end
- Used by malware authors to evade detection and analysis

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Inside-Out Approach

- Directly analyzes program behavior
- Not limited to particular obfuscation schemes

Dynamic Analysis

- Uses concrete values from program execution
- Covers only executed behavior

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Input-Dependent Jumps

- Jumps whose target address depends on the input
- Decision points in program execution
- Can provide branch conditions to improve the coverage

Symbolic Execution

• Generates constraints for each execution path

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It is hard to identify input-dependent jumps and branch conditions from obfuscated execution

- Expressions for the target address are too complex
- Application of symbolic execution fails or times out

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#### **Our Contribution**

Simplification of Obfuscated Execution

- Computation is represented by dynamic data flow graphs
- Non-input-dependent computation is simplified to a constant

Identification of Input-Dependent Jumps

- Relation of execution before and after obfuscation is revealed
- Branch conditions are identified with reasonable effort

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**Obfuscation Mitigation** 

- Simplify redundant operations with constant operands
- Generate and simplify dynamic data flow graphs from traces
- Traces are generated using dynamic binary instrumentation

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Directed Acyclic Multigraph

- Nodes represent computed values
- Nodes have id, type, and additional information
- Edges are directed from operands to operations
- Edges are labeled by position numbers.

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941913: jmp 0x8b1049 42: xor eax, eax r\_42\_eax  $s_{text} = 0x008b1000$ 2 0x00000049 2 Xor Add 1 1 w\_941913\_eip w\_42\_eax

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# **Graph Generation**

- A graph initially has nodes for output values of interest (the target address of jumps)
- It grows by adding predecessors to nodes
- For write access, nodes are added for the operation and reading of the operands
- For read access, nodes are added for the writing of its value
  - If there is no latest writing, a node for an input variable is added
- Graphs grow until no node can be added

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Simplification rules are applied until no rule can be applied

- Constant value identification
  - Value embedded in the binary
  - Value of the trap flag
- Constant value propagation
- Data movement simplification
- Operation simplification
- Nodes that do not reach an output node are removed

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### Simplification Rule Samples

Rules using associativity:

- $(\operatorname{\mathsf{Add}} x \ \dots \ (\operatorname{\mathsf{Add}} y \ \dots)) \to (\operatorname{\mathsf{Add}} x \ \dots \ y \ \dots)$
- Same for And, Mul, Or, Xor

Like terms are combined:

• 
$$(\operatorname{Add} \underbrace{x \dots x}_{20}) \to (\operatorname{Mul} x 20)$$

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Rules using identity:

- $(\operatorname{Add} x (\operatorname{Neg} x)) \rightarrow 0$ ,  $(\operatorname{Add} x 0) \rightarrow x$
- $(\operatorname{And} x (\operatorname{Not} x)) \rightarrow 0$ ,  $(\operatorname{And} x 0) \rightarrow 0$ ,  $(\operatorname{And} x x) \rightarrow x$
- $(\operatorname{Neg}(\operatorname{Neg} x)) \to x$ ,  $(\operatorname{Not}(\operatorname{Not} x)) \to x$
- $(\operatorname{Or} x 0) \to x$ ,  $(\operatorname{Or} x x) \to x$
- $(\operatorname{Xor} x 0) \to x$ ,  $(\operatorname{Xor} x x) \to 0$

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# Input-Dependent Jump Identification

A jump is input-dependent if its simplified graph has:

- a node for an outside input variable or
- a node for a result of a system-dependent operation

If an input-dependent jump is found, all access to flag operation results in the computation of the jump is considered as used

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- Most jumps in obfuscated execution are not input-dependent
- Numbers of identified input-dependent jumps are often same for obfuscated and original execution
- Branch condition can be understood using simplified graphs

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# Samples

- Factorial and bubble sort programs
  - For x86 Windows
  - Obfuscated by Code Virtualizer 1.3.9.10 and 2.2.2.0, Themida 2.4.6.0, and VMProtect 2.13.6 and 3.1.2.830
- Tigress Challenges
  - For x64 Linux

-

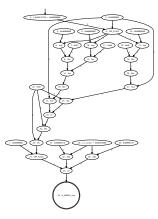
Obfuscator	Total Jumps	Identified Jumps
Original	22	11
Code Virtualizer 1	24752	11
Code Virtualizer 2	10492	11
Themida 2	9895	887
VMProtect 2	56198	11
VMProtect 3	16785	11

# Jumps from Bubble Sort of 3, 2, and 1

Obfuscator	Total Jumps	Identified Jumps
Original	19	6
Code Virtualizer 1	33502	6
Code Virtualizer 2	12062	6
Themida 2	11350	968
VMProtect 2	35213	40
VMProtect 3	16635	6

Obfuscator	Total Jumps	Identified Jumps
0000/challenge-0	2872	0
0000/challenge-1	11426	1
0000/challenge-2	10409	3
0000/challenge-3	3421	0
0000/challenge-4	2725	1
0003/challenge-0	24623	2
0003/challenge-3	3579	1

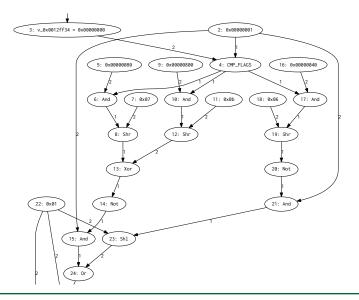
### Simplified JNLE Obfuscated by Code Virtualizer 1



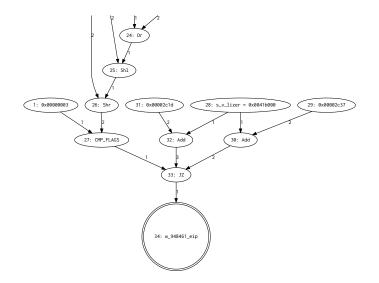
15,863 nodes and 19,717 edges ightarrow 34 nodes and 40 edges

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## Simplified JNLE Obfuscated by Code Virtualizer 1



# Simplified JNLE Obfuscated by Code Virtualizer 1



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# Conclusion

- Generation and simplification of dynamic data flow graphs can remove the effect of obfuscation
- Input-dependent jumps can be used to reveal the relation between obfuscated and original execution
- Performance can be improved by using better algorithms with parallel execution
- Our work can be applied to improve other techniques such as symbolic execution
- We plan to perform further control flow analysis

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