VMHunt: A Verifiable Approach to Partially-Virtualized Binary Code Simplification

ACM CCS 2018 Dongpeng Xu, Jiang Ming, Yu Fu, Dinghao Wu

김영철

2019. 3. 14.

Introduction

- Virtualization
 - 코드를 복잡하게 만들어..
 - 분석하기 어렵게 만들어..
 - 하지만 전체 프로그램에 대해 적용하면 원래의 코드에 비해 성능이 안좋아져..
 - 부분적으로 적용하는 것이 최고다..

Introduction

- reverse engineer the bytecode interpreter
 - a central loop : code fetch
- strip off the virtualization obfuscation layer from the tedious execution instructions
- # Assume the scope of virtualization-obfuscated code is already known.
- → Automatic detection of the virtualized code is an indispensable step

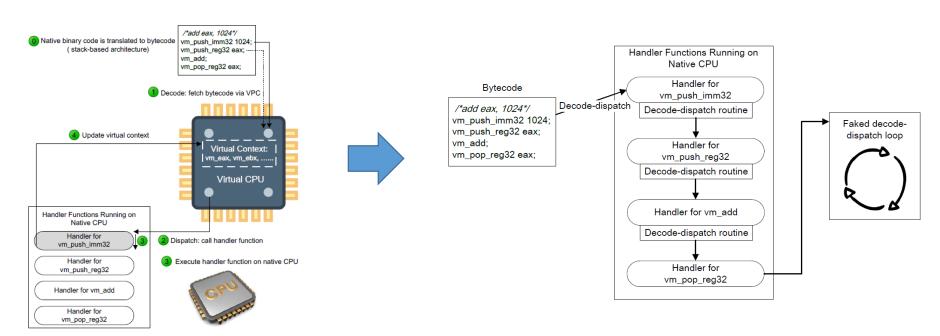
Introduction

VMHunt

- can detect the virtualized code section from a program execution trace
- design a new optimization method to simplify the execution trace based on boundary information
- be capable of performing correctness testing to the deobfuscation results

Background and Motivation

- Threaded Interpretation
 - 연구자들한테 decode-dispatch 구조가 매우 잘 알려져있음.
 - central decode-dispatch loop routine 제거



" VPC" in step 1 is short for Virtual Program Counter

Background and Motivation

- Virtualization-Obfuscated Malware
 - 프로그램 전체를 가상화 하는 것은 사이버 범죄자들에게 좋은 선택은 아님.
 - 높은 CPU 사용률에 대한 감시를 하면 걸리기 때문.
 - 핵심 부분만 가상화 하는 것이 필수임.

Overview – VMHunt's workflow

- Virtualized Snippet Boundary Detection.
- Virtualized Kernel Extraction.
- Multiple Granularity Symbolic Execution

Overview – VMHunt's workflow

 Virtualiz Trace Trace Virtualiz Virtualized Snippet 1 Multiple Granularity Multiple Virtualized Kemel Extraction Symbolic Execution Binary Code Trace Virtualized Snippet 01001 Recording Boundary Detection 10010 Virtualized 01010 Snippet 2 00010 Kernel 2 Virtualized Kemel Multiple Granularity Symbolic Execution Extraction Virtualized snippet 2 Normal instruction Context switch instruction Virtualized snippet 1

- Trace Logging
 - Pin tool을 이용한 dynamic tracing 시스템 콜을 제외한 모든 명령어를 기록
 - trace information
 - (1) The memory address of every instruction
 - (2) The instruction name (opcode)
 - (3) The source and destination operands
 - (4) Runtime information (register, memory accessing address)

- Context Switch Instructions
 - 계속 언급되듯이 모든 영역을 가상화 하는 것은 비효율적.
 - 핵심이 되는 코드 영역만 부분적으로 가상화 함.
 - native 환경과 virtual 환경 간의 context switching이 존재할 것이고 탐지할 것.

```
// native program execution
                  // context saving
 2 push edi
 3 push esi
 4 push
 5 push edx
 6 push
 7 push ecx
 8 push eax
9 pushfd
10 imp
        0x1234
                  // virtualized snippet begin
12 mov
13 add
14 xor ...
                  // virtualized snippet end
16 popfd
17 pop
                  // context restoring
18 pop
        ecx
19 pop
        ebp
20 pop
        edx
21 pop
22 pop
        esi
23 pop
        edi
24 jmp
        0x8048123
                  // continue native program
                  // execution
```

```
2-9 line : context saving
```

11-15 line : virtualized snippet

17-23 line : context restoring

Context Switch Instructions

```
1 push esi,ecx,edx
2 push
3 push
        ebp
4 add
         esp, 0x4
         esp, 0x4
         ebp, esp
         eax, 0x3ff90adc
         eax, 0x3ff90ad8
10 add
         eax, 0x4
         ebp, esp
12 xor
         esp, ebp
         ebp, esp
         [esp], edi
15 mov
        ebp, eax
16 push ebx
17 | . . .
```

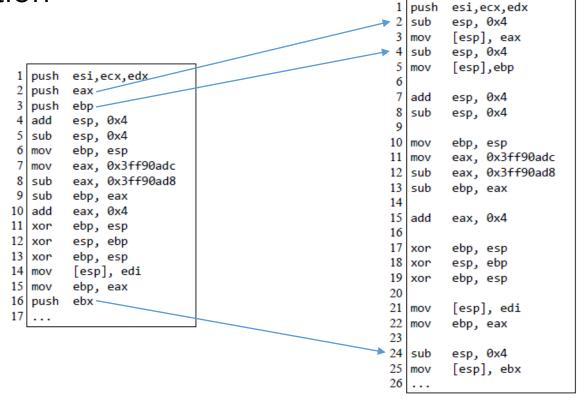
```
esi,ecx,edx
         esp, 0x4
         [esp], eax
4 sub
         esp, 0x4
         [esp],ebp
  add
         esp, 0x4
  sub
        esp, 0x4
10 mov
         ebp, esp
         eax, 0x3ff90adc
12 sub
         eax, 0x3ff90ad8
13 sub
        ebp, eax
14
   add
        eax, 0x4
16
17 xor
         ebp, esp
         esp, ebp
   xor
         ebp, esp
         [esp], edi
   mov
         ebp, eax
23
         esp, 0x4
  sub
         [esp], ebx
26 ...
```

```
esi,ecx,edx
        esp, 0x4
         [esp], eax
   mov
 4 sub
        esp, 0x4
        [esp],ebp
   add esp, 0x4
   sub esp, 0x4
  mov ebp, esp
11 mov eax, 0x3ff90adc
12 sub eax, 0x3ff90ad8
13 sub ebp, eax
14 sub ebp, 0x4
15
   add eax, 0x4
   mov t, esp
   mov esp, ebp
   mov ebp, t
21
   <del>mov ebp, esp</del>
   sub esp, 0x4
   mov
         [esp], edi
   mov
        ebp, eax
27
  sub
         esp, 0x4
   moν
        [esp], ebx
```

```
esi,ecx,edx
         esp, 0x4
         [esp], eax
         esp, 0x4
                              Context
 5 mov
         [esp],ebp
                              Switch
         esp, 0x4
         [esp], edi
         esp, 0x4
 8 sub
         [esp], ebx
10
11 add
         eax, 0x4
12 mov
         ebp, eax
13 | . . .
```

Context Switch Instructions

Normalization

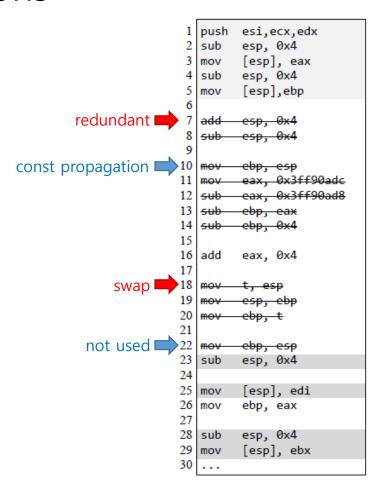


- Context Switch Instructions
 - Simplification
 - a peephole optimizer & a data flow analyzer
 - peephole optimizer : use patter matching
 - data flow analyzer: records def-use information, perform constant propagation

Context Switch Instructions

Simplification

esi,ecx,edx esp, 0x4 [esp], eax esp, 0x4 [esp],ebp mov esp, 0x4 add esp, 0x4 sub ebp, esp eax, 0x3ff90adc eax, 0x3ff90ad8 ebp, eax sub 14 15 add eax, 0x416 ebp, esp esp, ebp xor ebp, esp 20 21 [esp], edi mov ebp, eax mov 23 esp, 0x4 sub [esp], ebx mov 26



peephole optimizerdata flow analyzer

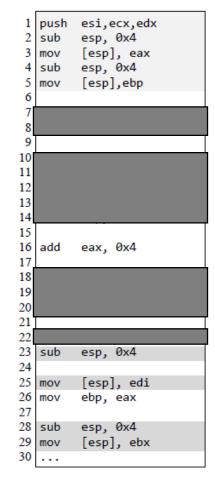
: 갑자기 생김

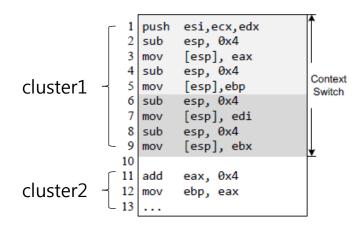
line 22-23 : 갑자기 생김

line 14

- Context Switch Instructions
 - Clustering
 - simplified trace 에서 instruction dependency graph 생성
 - dependency가 있는 명령어끼리 묶어서 그룹으로 나눔

Context Switch Instructions





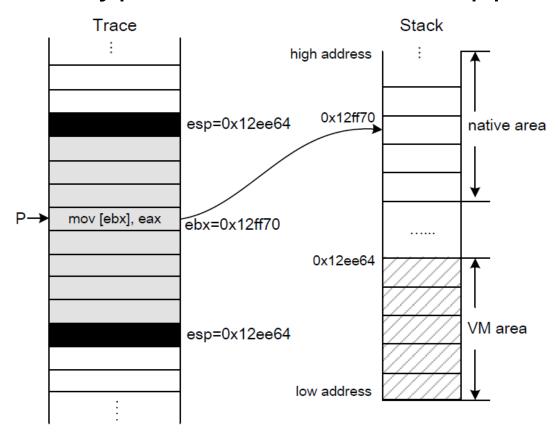
- Pairing Context Switch Instructions
 - 앞에서 context saving instructions 를 탐지함.
 - 다음은 context restoration instructions 와 pairing하여 가상화된 부분을 식별할 수 있게 됨.
 - Two heuristics
 - stack depth & execution transfer instruction
 - (1) 가상화 전과 가상화 복구 후의 stack depth는 같아야 함.
 - (2) context switch 는 jmp, call, ret 등과 같이 제어 흐름을 전이 시키는 명령어 근처에 존재함.

Pairing Context Switch Instructions

```
// native program execution
                                                                                                         // context saving
                                                 Execution Transfer Instruction
                                                                                           jmp
                                                                                                         // virtualized snippet begin
                                                                                         12 mov
stack depth at point A: N
                                                                                         13 add
                                                                                         14 | xor
                                                                                                         // virtualized snippet end
stack depth of virtualized snippet: N + 1
                                                                                          16 popfd
                                                                                                         // context restoring
stack depth at point B: N
                                                                                         21 pop
                                                                                         22 pop
                                                                                         23 pop
                                                 Execution Transfer Instruction
                                                                                                           continue native program
                                                                                                         // execution
```

- Two types of virtualized snippet behaviors
 - local behavior : 가상화 환경에만 영향을 주는 행동
 - global behavior : native 환경에 접근하거나 영향을 주는 행동
 - → real function 의 정보를 얻을 수 있음.
 - → 이와 관련된 명령어들도 중요한 정보

Two types of virtualized snippet behaviors



At point P, if ebx = 0x12ff70, then [ebx] indicates in native area.

thus, {mov [ebx], eax} instruction is global behavior.

- Virtualized kernel : global behavior 와 관련된 instructions
 - (1) The instruction to write data to the native area
 - directly passing
 - (2) The instruction to save data to the stack memory that will be swapped to registers by context switch.
 - indirectly passing

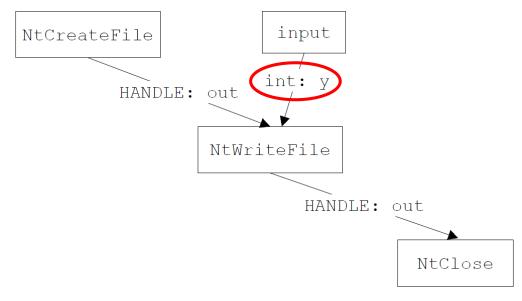
- Backward slicing to extract the kernel
 - apply BinSim's backward slicing algorithm.
 - be able to handle many complicated issues (e.g. implicit branch logic).
 - can significantly remove unnecessary instructions.

- Backward slicing algorithm
 - step1) do the system call sequences alignment
 - → to get a list of matched system call pairs step2) conduct backward slicing on each logged trace
 - → to identify instructions that affect the argument step3) compute the weakest precondition (WP)
 - → WP is a symbol formula
 - → identify the possible cryptographic functions step4) use a constraint solver to verify whether two WPs are equivalent
 - step5) perform an approximate matching on identified cryptographic functions, calculate the final similarity score

```
1: int x, y; // x is an input
2: HANDLE out = CreateFile("a.txt", ...);
3: y = x + x;
4: WriteFile(out, &y, sizeof y, ...);
5: CloseHandle(out);
```

```
1: int x, y, z; // x is an input
2: HANDLE out = CreateFile("a.txt", ...);
3: z = (x >> 31);
4: z = (x ^ z) - z; // z is the absolute value of x
5 y = 2 * z;
6: WriteFile(out, &y, sizeof y, ...);
7: CloseHandle(out);
```

```
1: int x, y; // x is an input
2: HANDLE out = CreateFile ( "a.txt", ... );
3: y = x << 1;
4: WriteFile ( out, &y, sizeof y, ... );
5: CloseHandle ( out );</pre>
```



<the aligned system call sequences>

```
1: int x, y; // x is an input
2: HANDLE out = CreateFile("a.txt", ...);
3: y = x + x;
4: WriteFile(out, &y, sizeof y, ...);
5: CloseHandle(out);
```

```
Formula_a = x + x
```

```
1: int x, y, z; // x is an input
2: HANDLE out = CreateFile("a.txt", ...);
3: z = (x >> 31);
4: z = (x ^ z) - z; // z is the absolute value of x
5 y = 2 * z;
6: WriteFile(out, &y, sizeof y, ...);
7: CloseHandle(out);
```

$$Formula_b = 2 * ((x \land (x \gg 31)) - (x \gg 31))$$

$$Formula_c = x \ll 1$$

$$Formula_a = x + x$$

- (a) and (c) are truly matched
- (a) and (b) <u>conditionally equivalent</u> (when the input satisfies x≥0)

$$Formula_b = 2 * ((x \land (x \gg 31)) - (x \gg 31))$$

$$Formula_c = x \ll 1$$

- extract the semantics of the virtualized code by symbolic execution.
- can verify whether our deobfuscation is a semantically equivalent translation.

- Modern virtualized code usually come with lots of bit-wise operations.
- Traditional SE fails to optimize the formulas which contain symbols in different granularity.

- Multiple Granularity Symbolic Execution
 - the length of symbols is not fixed
 - can perfectly optimize formulas
 - can generate neat formulas
 - → be easily handled by theorem solvers
 - "interpret" the semantics, rather than "translate"

- Multiple Granularity Symbolic Execution
 - (1) maintain runtime status of registers
 - (2) interpret the effect of each instruction, e.g., shl/shr
 - (3) remove redundant symbols if they become concrete values after the interpretation of the instruction

- Def 6.1. two types of value: concrete & symbolic C_n^m : id is n, m-bit concrete value
- Def 6.2. $[v_1, ..., v_n]$ is to represent the concatenation of n values. $[S_1^8, C_1^8, C_2^8]$ means a concatenation of the three 8-bit values (one symbolic value & two concrete values).
- Def 6.3. The symbol | is used for binding value $[S_1^8, C_2^8]|_{C_2^8=0x23}$ means that C_2^8 is bound to 0x23.

- Single
 - fixed granularity
 - redundant symbol, unoptimized symbol
 - too much time for a solver to solve them
- Multiple Granularity SE
 - handle above the limitations

- Single vs Multiple Granularity SE
 - apply two SEs for a example
 - take processes flow
 - check for results of SEs

```
mov eax, 0x12345678
mov ah, mem[0x14ff23]
shl eax, 4
and eax, 0x0ff00ff0
```

• Single vs Multiple Granularity SE

mov eax, 0x12345678

one byte single SE

$$[C_4^8, C_3^8, C_2^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_2^8 = 0x56, C_1^8 = 0x78}$$

$$C_1^{32}|_{C_1^{32}=0x12345678}$$

Single vs Multiple Granularity SE

mov eax, 0x12345678 mov ah, mem[0x14ff23]

one byte single SE

$$[C_4^8, C_3^8, C_2^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_2^8 = 0x56, C_1^8 = 0x78}$$

$$[C_4^8, C_3^8, S_1^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_1^8 = 0x78}$$

$$C_1^{32}|_{C_1^{32}=0x12345678}$$

$$[C_2^{16}, S_1^8, C_3^8]|_{C_2^{16} = 0x1234, C_3^8 = 0x78}$$

Single vs Multiple Granularity SE

one byte single SE

$$\begin{aligned} & [C_4^8, C_3^8, C_2^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_2^8 = 0x56, C_1^8 = 0x78} \\ & [C_4^8, C_3^8, S_1^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_1^8 = 0x78} \\ & S_3^{32} = shl(S_2^{32}, C_5^8)|_{S_2^{32} = [C_4^8, C_3^8, S_1^8, C_1^8], C_5^8 = 0x4} \end{aligned}$$

$$C_1^{32}|_{C_1^{32}=0x12345678}$$

$$[C_2^{16}, S_1^8, C_3^8]|_{C_2^{16}=0x1234, C_3^8=0x78}$$

$$[C_4^{12}, S_1^8, C_5^{12}]|_{C_4^{12}=0x234, C_5^{12}=0x780}$$

Single vs Multiple Granularity SE

one byte single SE

$$\begin{aligned} &[C_4^8, C_3^8, C_2^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_2^8 = 0x56, C_1^8 = 0x78} \\ &[C_4^8, C_3^8, S_1^8, C_1^8]|_{C_4^8 = 0x12, C_3^8 = 0x34, C_1^8 = 0x78} \\ &S_3^{32} = shl(S_2^{32}, C_5^8)|_{S_2^{32} = [C_4^8, C_3^8, S_1^8, C_1^8], C_5^8 = 0x4} \\ &S_4^{32} = and(S_3^{32}, C_6^{32})|_{C_6^{32} = 0x0ff00ff0} \end{aligned}$$

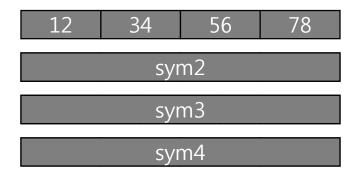
$$\begin{split} &C_1^{32}|_{C_1^{32}=0x12345678} \\ &[C_2^{16},S_1^8,C_3^8]|_{C_2^{16}=0x1234,C_3^8=0x78} \\ &[C_4^{12},S_1^8,C_5^{12}]|_{C_4^{12}=0x234,C_5^{12}=0x780} \\ &[C_4^{12} \wedge 0x0ff,S_1^8 \wedge 0x00,C_5^{12} \wedge 0xff0]|_{C_4^{12}=0x234,C_5^{12}=0x780} \\ &[C_6^{12},C_7^8,C_8^{12}]|_{C_6^{12}=0x034,C_7^8=0x00,C_5^{12}=0x780} \\ &[C_9^{32}|_{C_9^{32}=0x03400780} \end{split}$$

Multiple Granularity Symbolic Execution

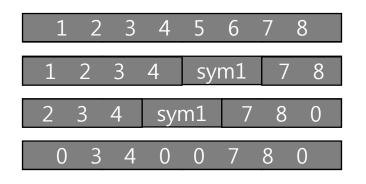
Single vs Multiple Granularity SE

```
mov eax, 0x12345678
mov ah, mem[0x14ff23]
shl eax, 4
and eax, 0x0ff00ff0
```

one byte single SE



6 constant values 4 symbolic values Multiple Granularity SE



9 constant values 1 symbolic value

Multiple Granularity Symbolic Execution

- In summary,
 - (1) Fine-grained Analysis
 - accurately interpret the semantics of bitwise operations
 - available to optimize for eliminating redundant symbolic values
 - (2) Flexibility
 - free to split/merge values without granularity restriction

Implementation

- VMHunt
 - Pin based trace logger
 - Multiple-grained symbolic execution engines
 - Parser for lifting a trace to the IR (encode symbolic & concrete values)
 - Boundary detector
 - Slicer
 - Optimizer
 - Utilities for CFG generation
 - 17,192 lines of C++ code, 341 lines of Perl code

- grep-2.21
- bzip2-1.0.6
- md5sum-8.24
- AES in OpenSSL-1.1.0-pre3
- thttpd-2.26
- sqlite-2.26

- Code Virtualizer
- Themida
- VMProtect
- EXEcryptor

- VMProtect and EXECryptor are similar.
- Themida and Code Virtualizer is the same.

- The virtualized snippet identified by VMHunt is about 10% of the whole trace size.
- The kernel is about 10⁻⁴ of the whole trace size.
 - → VMHunt can significantly reduce the size of trace.

- test data가 뭔지 잘 모르겠음..
- 저 프로그램들이 가상화 되어있다는 건지..? 맞는 것 같음.

Programs	T	S1	S2	S1+S2	K1	K2	K1+K2	(S1+S2)/T(%)	$(K1+K2)/T(10^{-4})$
grep	1,072,446	130,329	168,857	299,186	552	1,061	1,613	24.6	15.0
bzip2	1,422,428	133,272	153,537	286,809	774	1,444	2,218	20.2	15.6
aes	2,479,948	124,793	156,019	280,812	837	1,173	2,010	11.3	8.1
md5sum	2,309,826	134,320	168,163	302,483	604	1,271	1,875	13.1	8.1
thttpd	3,680,610	117,435	155,262	272,697	677	1,389	2,066	7.4	5.6
sqlite	4,716,883	146,177	161,073	307,250	820	1,465	2,285	6.5	4.8

• 1-byte vs 1-bit vs Multiple Granularity SE

SE	Metrics	grep	bzip2	aes	md5sum	thttp	sqlite
	size	671	459	674	801	792	997
byte	var #	1289	2071	3215	4318	4730	6103
	time	90	105	150	152	144	183
	size	7992	5205	5310	9134	6840	10289
bit	var #	25110	41947	69827	87638	80592	13609
	time	383	486	532	517	793	-
	size	71	128	218	239	291	348
MG	var #	408	558	544	673	804	930
	time	12	16	13	14	20	23

Multiple VMs Virtualization (nested virtualization)

Programs	T	S1	S2	S1+S2	K1	K2	K1+K2	(S1+S2)/T(%)	$(K1+K2)/T(10^{-4})$
grep	1,217,671	122,615	231,807	354,422	537	1,458	1,995	29.1	16.4
bzip2	1,594,486	120,103	206,049	326,152	713	1,540	2,253	20.8	14.1
aes	2,566,455	110,801	240,743	351,544	792	1,675	2,467	13.7	9.6
md5sum	2,310,301	138,508	249,138	387,646	649	1,549	2,198	16.8	9.5
thttpd	3,691,011	123,080	277,226	400,306	711	1,563	2,274	10.8	6.2
sqlite	4,764,819	143,995	294,373	438,368	802	1,898	2,700	9.2	5.7

- Malware samples Botnet, Virus, Ransomware
 - be already known as being virtualized

Name	Type	Т	S	K	S/W	K/W
chodebot	Botnet	1,967,000	150,129	930	5.9	4.7
nzm	Botnet	6,141,556	181,457	1432	3.0	2.3
phatbot	Botnet	2,224,405	152,723	1008	6.9	4.5
zswarm	Botnet	5,587,140	168,529	1395	3.0	2.5
tsgh	Botnet	5,199,837	145,372	1362	3.0	2.6
dllinject	Virus	8,634,893	174,232	1568	2.0	1.8
locker_builder	Virus	10,435,886	198,695	1293	1.9	1.2
locker_locker	Virus	4,594,868	146,960	893	3.2	1.9
temp_java	Virus	8,661,836	185,380	1504	2.1	1.7
tears	Ransom	2,658,615	143,308	1074	5.4	4.0

[→] the virtualized part is actually the procedure of key generation. (tears case)

- Unvirtualized Programs
 - Snippet 4 and 7 are real virtualization snippet.
 - the ratio between kernel and the snippet is a good metric.
 - the snippet length is also a good metric.

Snippet	S	K	K/S(%)
1	5,371	5,103	95.01
2	218	218	100.00
3	3,557	3,282	92.27
4	130,329	552	0.42
5	1,697	1,572	92.63
6	2,392	2,288	95.61
7	168,857	1061	0.63

- Performance
 - VMHunt : trace logging and offline analysis
 - the overhead of trace logging is about 5X slow down.

Programs	BD	K-Extraction	MGSE	Total
grep	7.2	4.8	5.3	17.3
bzip2	9.3	3.7	4.7	17.7
aes	10.9	4.1	6.3	21.3
md5sum	11.4	4.9	5.8	22.1
thttpd	14.7	4.7	5.1	24.5
sqlite	16.9	5.1	6.7	28.7

<execution time of offline analysis>

Discussion

- VMHunt's limitations & countermeasures
 - insufficient path coverage
 - automatically generate new inputs to explore uncovered paths.
 - in dynamic binary instrumentation environment
 - run malware in a transparent environment.
 - can mislead the detection of VM context switch by inserting redundant context switch instructions
 - can be removed in the simplification
 - can check whether the switched context is actually used in the kernel
 - can strengthen obfuscation by diversifying VM contexts & handler
 - semantics-based simplification is able to deal with it

Discussion

- if the whole program is virtualized, VMHunt can not detect.
 - because no context switch occur
 - but whole program virtualization rarely happens in practice
- can customize a VM that only uses some of the registers
 - so the context switch instructions would only save/restore those used registers.
 - but have not observed any VM using partial registers

E N D

