

# Malware Analysis – Connecting Variants and Versions

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Demo

# MAGIC Connect – Summary

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According to Cythereal's Malware Genomic Correlation (MAGIC) analysis, this file is similar to files with following sha1 hashes:

- \* 203a5a96357f4de279a9186f0f7845ba94e9ea7a
- \* b33d63d3b6046f86c8243d7994bf9867bfb49fac
- \* 156e0969d4fec167e8010ca9b7315336284eb0e
- \* d52d8b4e8ec25281c28f8f48ab7e090cc0cce088

For further information, please contact [magic@cythereal.com](mailto:magic@cythereal.com).

Posted 9 hours, 42 minutes ago by [arunlakhotia](#) file: [ebf6a3bfd5d62b67a8718857881e90d97939ecf837711f36671a40b2d07d2a67](#)



According to Cythereal's Malware Genomic Correlation (MAGIC) analysis, this file is similar to files with following sha1 hashes:








- \* 354b9fadd20c182adbb88cc1e33a1ee298f6bff0
  - \* 2b1d23d0599c5d463fc56415eaa2bf12bfc7968
  - \* 4b5375a69bbec811983bd28f03aa1088ab7540b3
  - \* 8e6c7a5cf56413f30417496cd9e39b0940f431c
  - \* ab99fa5034a17429bea1bfde2d3de97376dd09d5
  - \* 7bad8ef82bc2d2090658885ecee4ab5accb0c8b8
  - \* ae58a88e7747d097ed92496bd848c3019c04bcd2
  - \* d5f7cd760496ca1a57e9e210bd8397a7a956d6d4
  - \* 366483d6bf8fd184679da786800e7871ff916aa4
  - \* 2245e306039555fa5b8a18d96fd4fc40c91113e7
- and 16 other files.

For further information, please contact [magic@cythereal.com](mailto:magic@cythereal.com).

# MAGIC Connect: Full report

MAGIC Report: 1f1f560c29db6a61b05212eea0e3c68de0b9d61e

FOLLOW THIS LINK: <http://beta.magic.cythereal.com/report/1f1f560c29db6a61b05212eea0e3c68de0b9d61e>

File Info	Magic Matches	Malware Categories	Genomic Features
Show 10 entries			
Matched Binary	Match Type	Similarity	
<a href="#">2fc845f420939d77101f7b52e0df38bc3c0fe42e</a> 	similar_packer_similar_payload	0.9873	
<a href="#">30d86ea21f9d259e1ed9c6de370aa9bbe5c553e0</a> 	similar_packer_similar_payload	0.9339	
<a href="#">325fc074649a6c50b11f0e186a1f2f0f61369ed9</a> 	similar_packer_different_payload	0.9077	
<a href="#">32bf511bbadf07651ddb9aa4a925e6e0719b67ed</a> 	similar_packer_similar_payload	0.9167	
<a href="#">531245bf0ccbf9341dca56181388a8864a14eb03</a> 	different_packer_similar_payload	0.8997	
<a href="#">7ab317c5afb6325463f4fd7f7b4815eab320ef0e</a> 	similar_packer_similar_payload	0.9357	
<a href="#">7e2aae5b6f88cf297ed29358ac522b452e3deae7</a> 	similar_packer_similar_payload	0.9384	

# MAGIC Report via API

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- ▶ <https://api.magic.cythereal.com/magic/1cf646f9fa78a5c253647dd9220d0502/ff9790d7902fea4c910b182f6e0b00221a40d616/>

# Find Matching Procedures (via API)

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- ▶ <https://api.magic.cythereal.com/search/procs/|cf646f9fa78a5c253647dd9220d0502/ff9790d7902fea4c9|0b|82f6e0b0022|a40d6|6/0x|000>

# MAGIC Features, via API

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- ▶ <https://api.magic.cythereal.com/show/proc/1cf646f9fa78a5c253647dd9220d0502/ff9790d7902fea4c910b182f6e0b00221a40d616/0x1000>

# API Documentation

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- ▶ <https://api.magic.cythereal.com/docs>
- ▶ <http://docs.cythereal.com>
- ▶ **Other links:**
- ▶ <http://www.virustotal.com/en/arunlakhota>
- ▶ <http://beta.magic.cythereal.com/>



# Cythereal MAGIC API Key

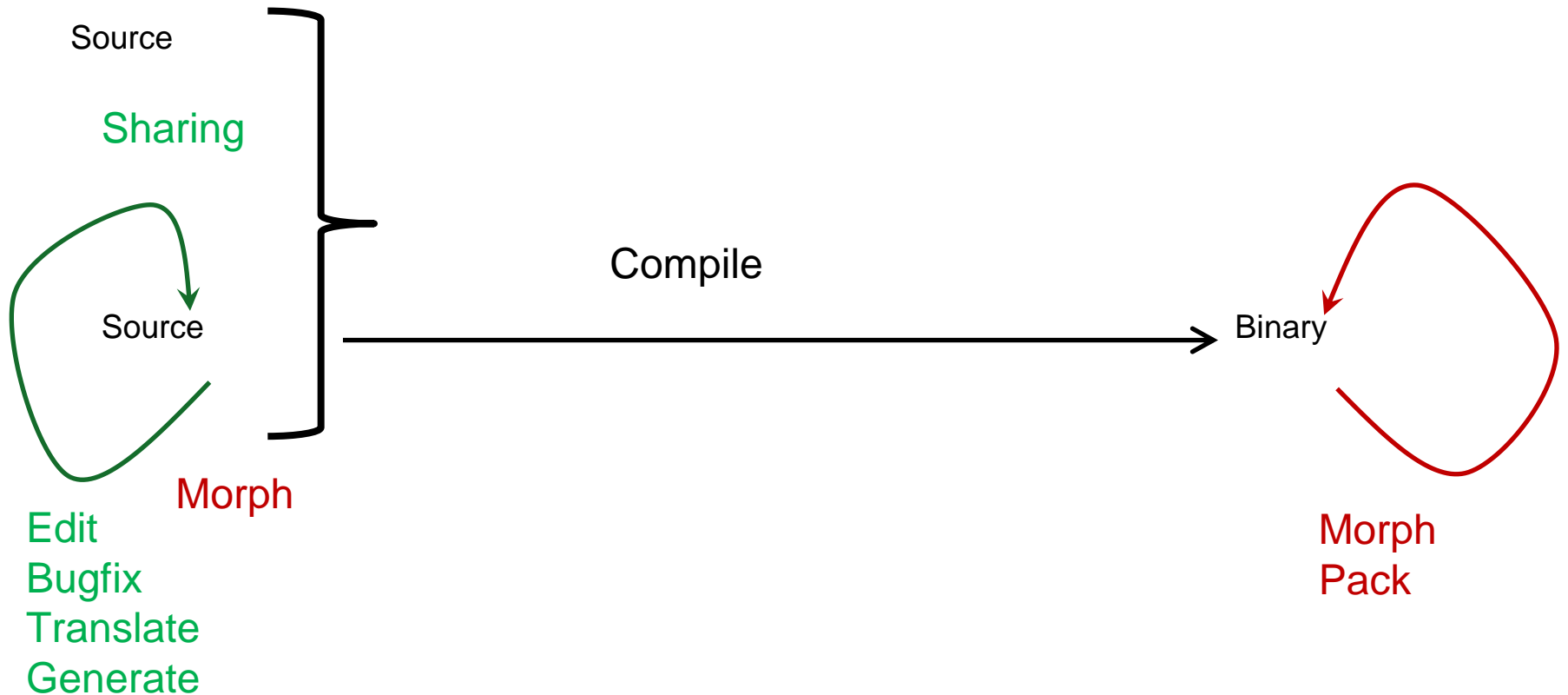
---

- ▶ Temporary API Key for ISSISP
  - ▶ Icf646f9fa78a5c253647dd9220d0502
- ▶ To get own key:
  - ▶ Visit <https://api.magic.cythereal.com/docs/>
  - ▶ Look for “Register”
  - ▶ Click on “Try It Out”
  - ▶ Fill form, and “Execute”

# Problem Definition

# Malware (software) Generative Process

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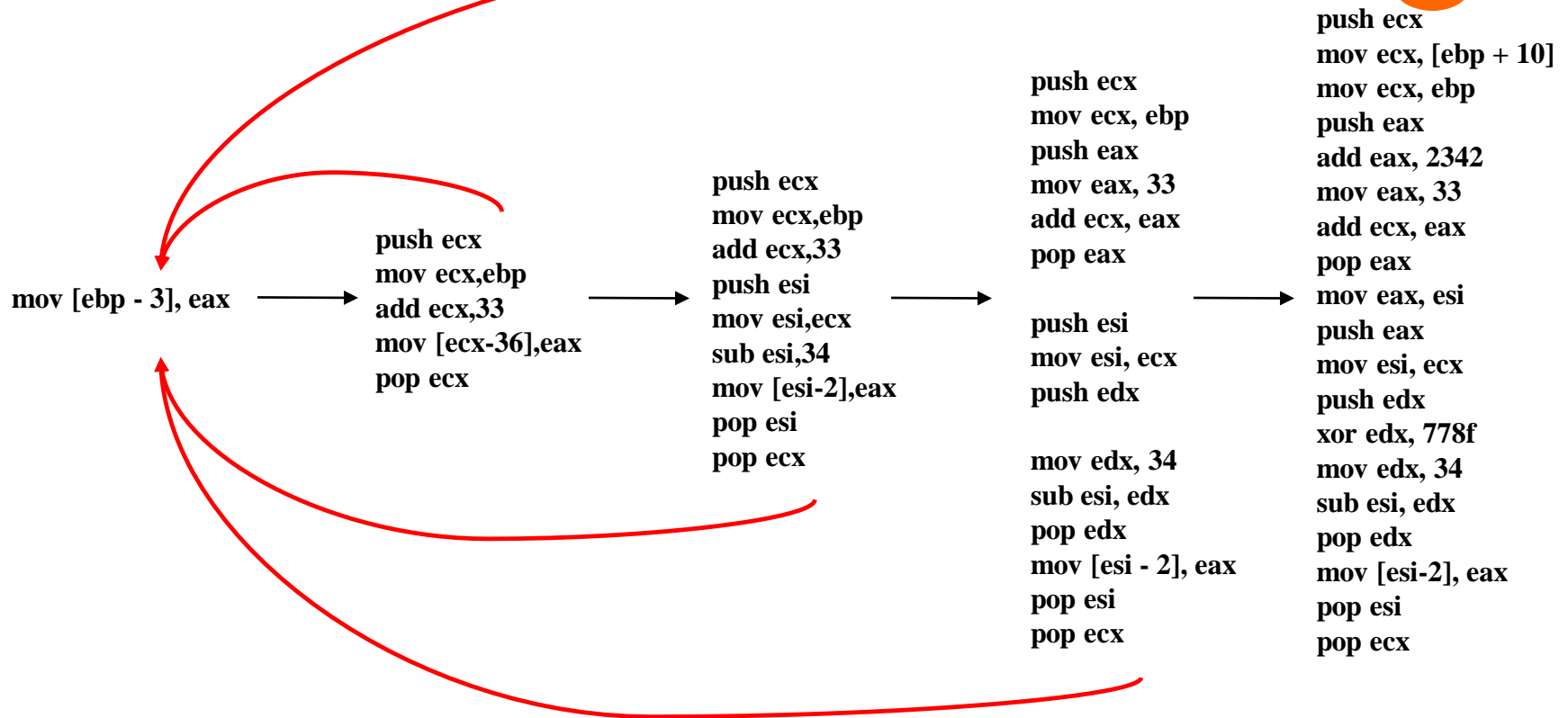


# Problem

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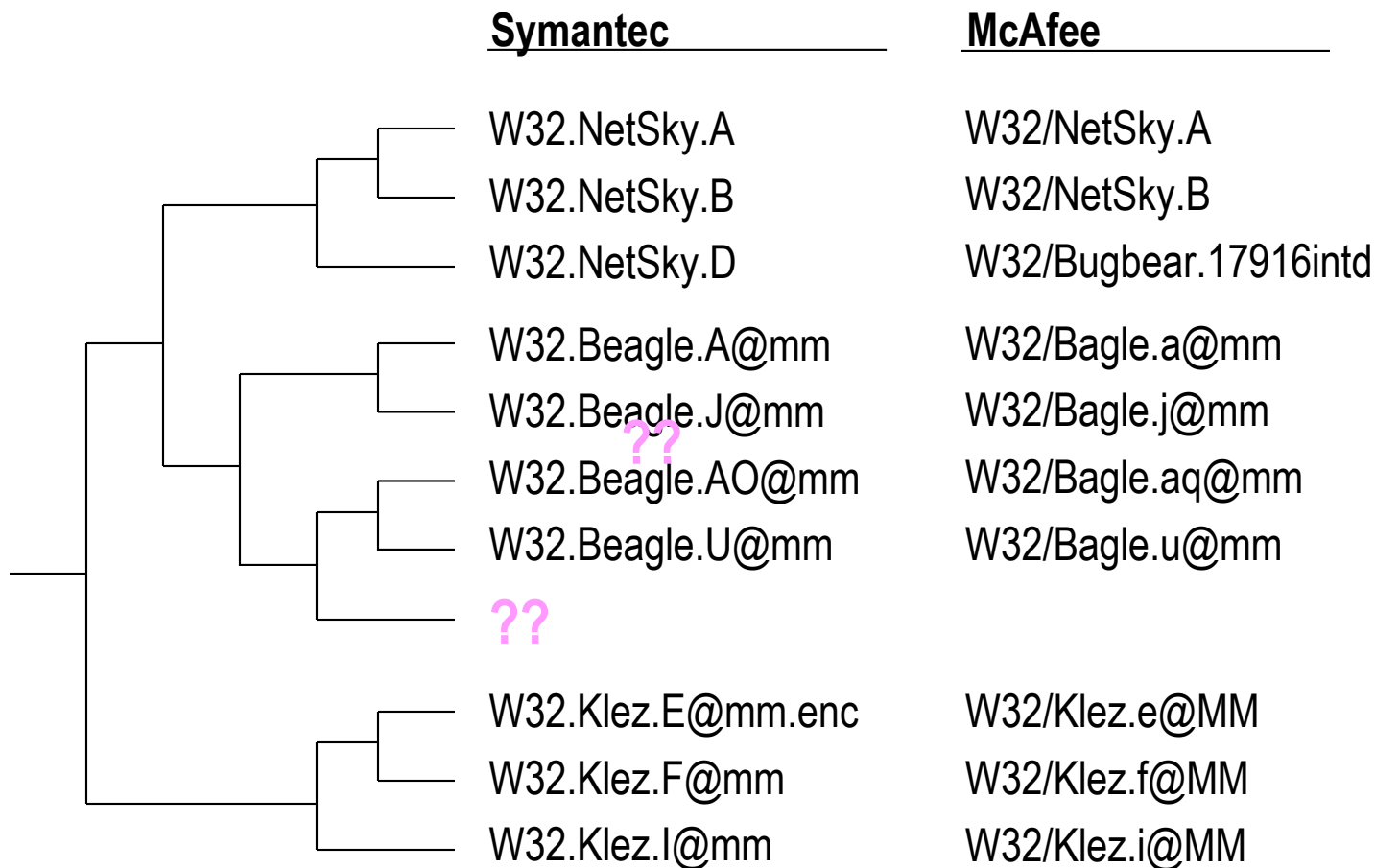
- ▶ Given a collection of malware, consisting of VERSIONS and VARIANTS:
  - ▶ find malware similar to a given file
  - ▶ find functions (disassembled) similar to a given

# Challenge: “Undo” Metamorphosis





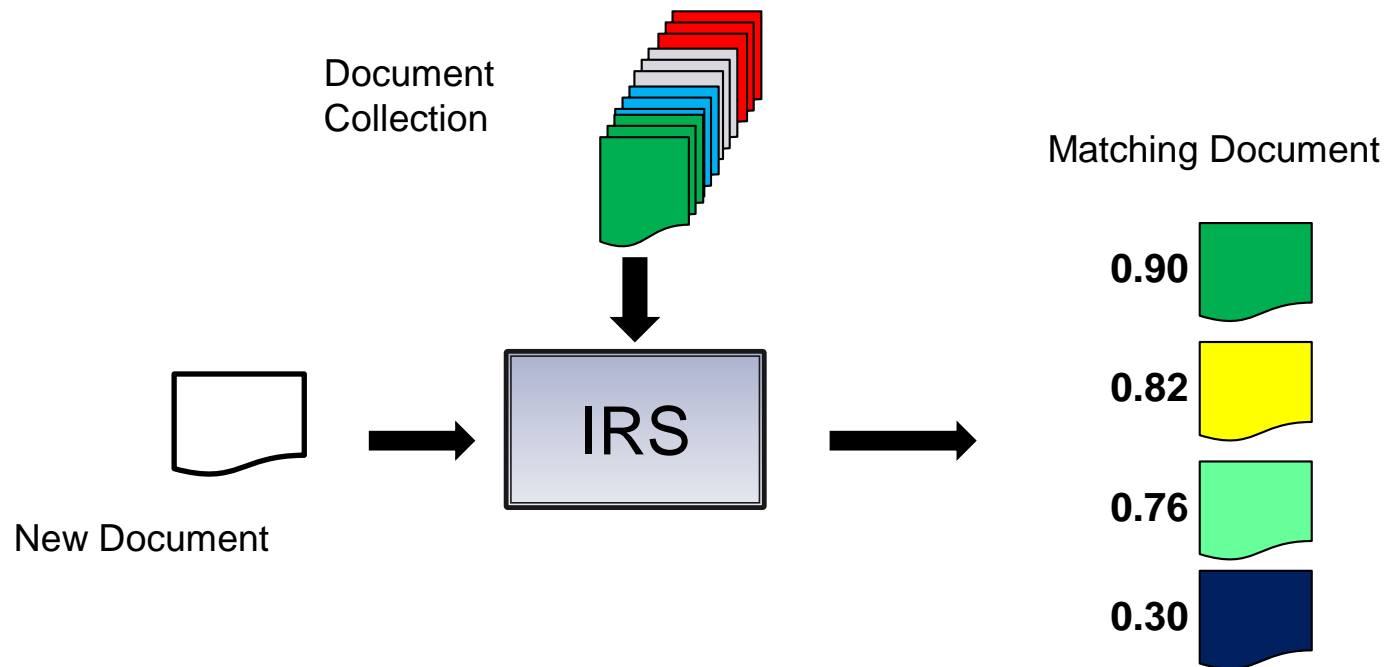
# Challenge: Similar Binaries



# Information Retrieval

# Info Retrieval: Use Case - I

## ► Nearest Match (Unsupervised)

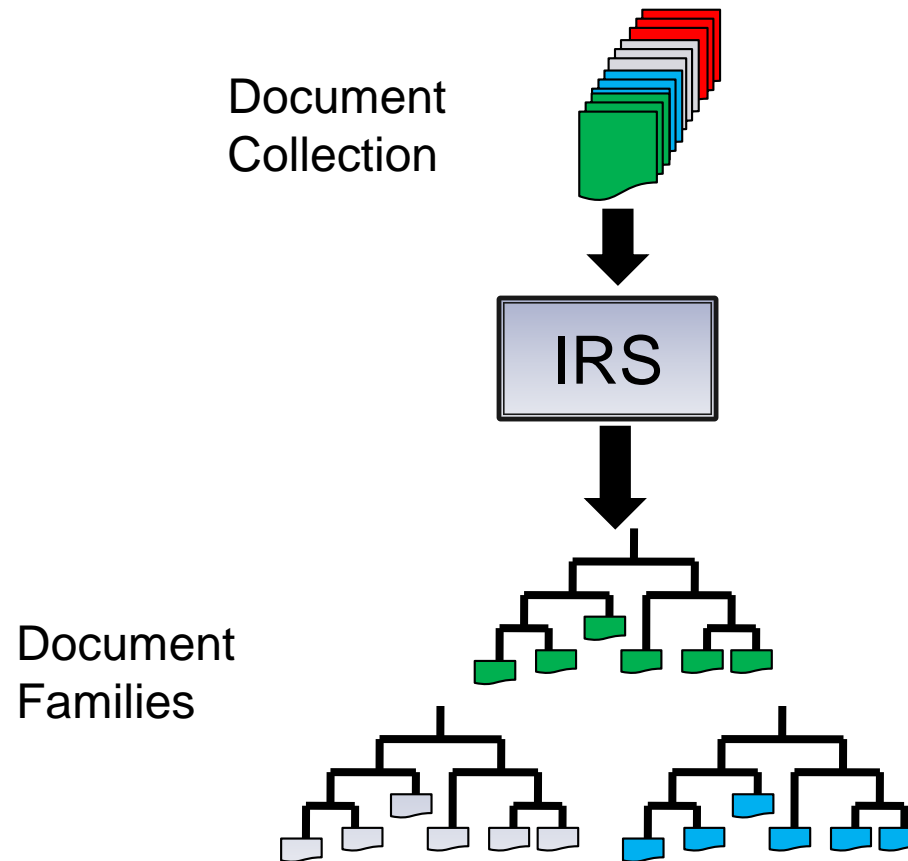




# Info Retrieval: Use Case - 2

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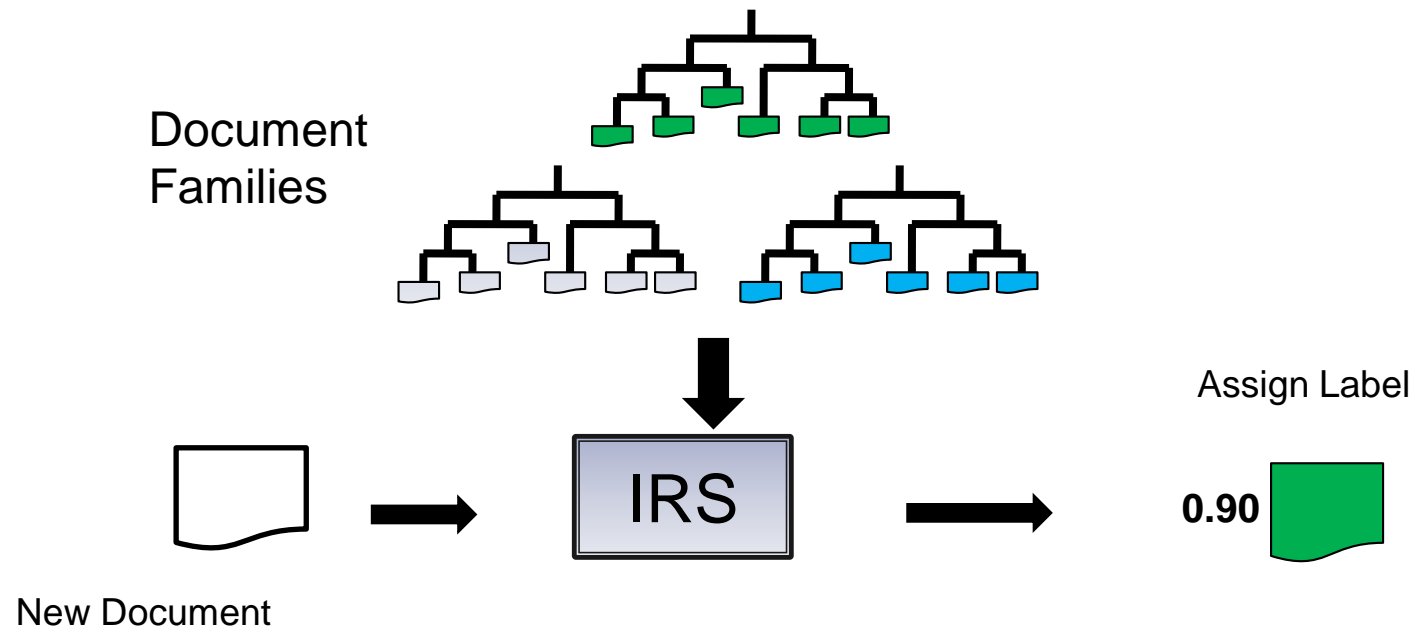
## ► Partition Collection (Unsupervised)



# Info Retrieval: Use Case - 3

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## ► Match Label (Supervised)



# Step 1: Model ‘Documents’

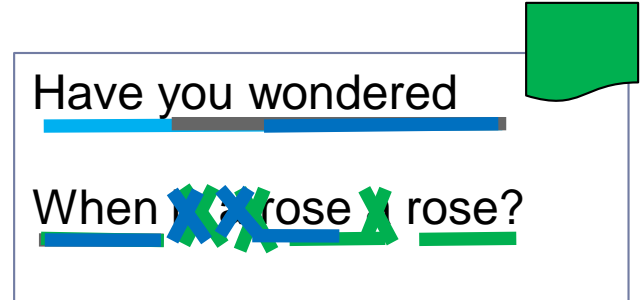
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## Bag of features model

1. Define a method to identify “features”

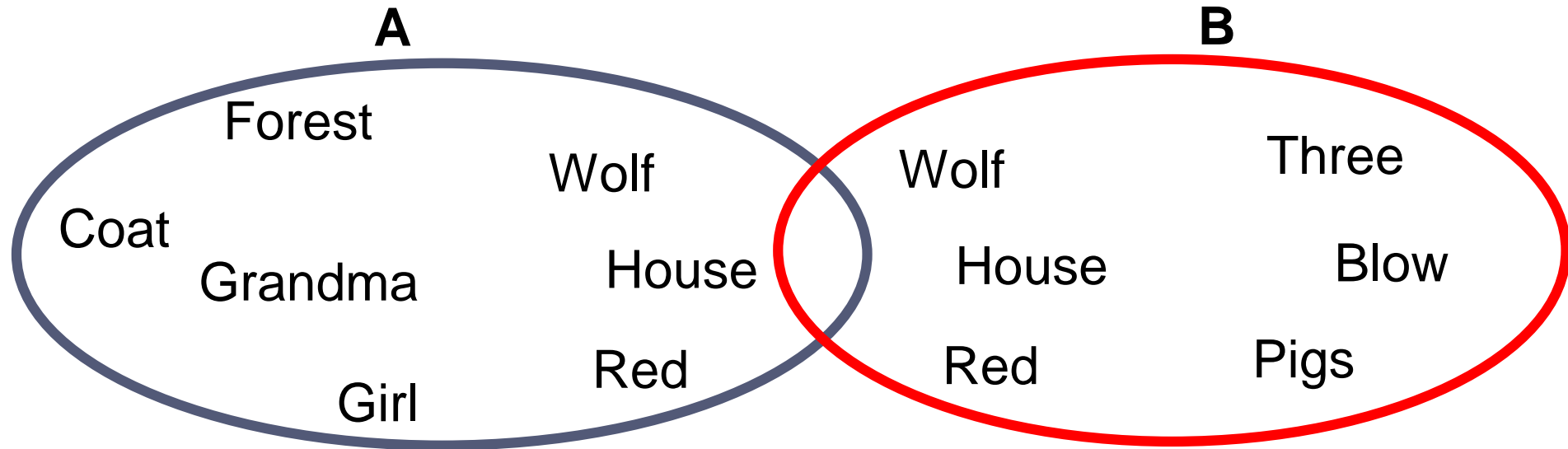
Example: k-consecutive words

2. Make a bag of features



## Step 2: Define Similarity Function

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$$\begin{aligned}\text{Similarity}(A,B) &= |A \cap B| / |A \cup B| \\ &= 3 / 10 \\ &= 0.3\end{aligned}$$

# Alternate: Vector Space Model

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Vector Space: Ordered list of ALL of the words in ALL of the documents:

Blow x Coat x Forest x Girl x Grandma x House x Pigs x Red x Three x Wolf

Vector: A Boolean vector representing presence/absence of a word

**A**

[0, 1, 1, 1, 1, 1, 0, 1, 0, 1]

**B**

[1, 0, 0, 0, 0, 0, 1, 1, 1, 1]

Distance: Euclidian Distance between two points.

Benefits: Can use vector processors (Nvidia, Google Tensorflow)

Cons: Very, very large vectors

# Step 3: Choose/create algorithm

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## ▶ Supervised Learning

- ▶ Neural Networks
- ▶ Bayesian Statistics
- ▶ Inductive Learning
- ▶ Support Vector Machines
- ▶ Regression

## ▶ Unsupervised Learning

- ▶ K-Means Clustering
- ▶ Hierarchical Clustering
- ▶ K-Nearest Neighbor

## ▶ Semi-supervised

- ▶ Use some labels to seed clusters

# Modeling Malware as Documents

# Modeling Malware as Documents

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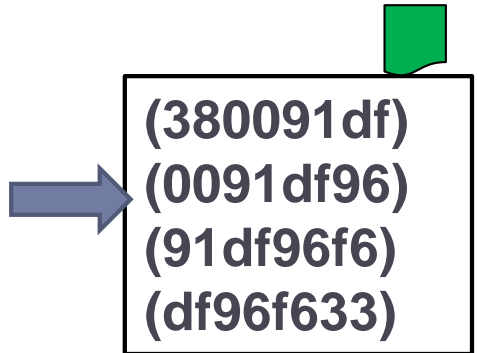
- ▶ Create a bag of features of binaries
  - ▶ such that `similar` programs have `similar` bags
- ▶ Similar programs:
  - ▶ Related through code evolution
    - ▶ New capability, bug fixes
    - ▶ Code reuse, shared libraries, shared strategies
    - ▶ Stealth – deliberate attempt to hide similarity



# Malware Document: Byte N-gram

00000000	3b	00	91	df	96	f6	33	73	7f	f1	de	13	a2	8a	45	30
00000010	f6	01	ff	e2	52	43	15	4e	1c	a9	bf	9a	1c	41	8b	40
00000020	fa	14	30	24	2f	ed	bc	00	7d	46	4c	32	03	f2	ba	69
00000030	dd	f5	28	87	84	20	61	f5	c9	3a	54	c2	98	9e	c1	11
00000040	20	df	23	16	22	64	71	90	c1	2c	7c	1e	68	0e	e2	28
00000050	66	b8	d2	05	2e	e7	75	11	1b	c8	4e	4c	d4	9b	4a	8b
00000060	69	75	fb	de	05	b3	4f	f2	dc	26	04	4a	02	2a	2c	56
00000070	55	ef	93	07	e6	a3	2f	01	4a	d9	75	3d	b8	2b	13	f1
00000080	a3	30	7d	c5	e2	0f	69	16	03	21	51	0e	b5	d5	08	98
00000090	3e	ca	c5	22	5f	b0	d4	3d	2e	78	11	92	99	66	24	5a
000000a0	56	96	74	41	cd	41	91	d4	02	65	ca	20	3e	1c	a4	c1
000000b0	c9	b6	e9	aa	89	89	40	e4	66	c4	d4	3f	49	85	e5	66
000000c0	56	82	93	f9	94	87	15	9c	2f	46	08	30	01	79	28	e3
000000d0	41	e7	29	24	ad	21	0a	4b	e0	79	ea	7f	fd	4b	ec	10
000000e0	a9	b8	23	96	69	17	a9	4e	8b	13	0d	5c	4c	28	28	f2
000000f0	ae	e7	6e	d8	e8	54	7e	15	da	51	2d	38	00	5f	59	26
~~~~~																

Word = N-Bytes



(380091df)  
(0091df96)  
(91df96f6)  
(df96f633)

# Malware Document: Abstracted Bytes

```
00000000 3b 00 91 df 96 f6 33 73 7f f1 de 13 a2 8a 45 30
00000010 f6 01 ff e2 52 43 15 4e 1c a9 bf 9a 1c 41 8b 40
00000020 fa 14 30 24 2f ed bc 00 7d 46 4c 32 03 f2 ba 69
00000030 dd f5 28 87 84 20 61 f5 c9 3a 54 c2 98 9e c1 11
00000040 20 df 23 16 22 64 71 90 c1 2c 7c 1e 68 0e e2 28
00000050 66 b8 d2 05 2e e7 75 11 1b c8 4e 4c d4 9b 4a 8b
00000060 69 75 fb de 05 b3 4f f2 dc 26 04 4a 02 2a 2c 56
00000070 55 ef 93 07 e6 a3 2f 01 4a d9 75 3d b8 2b 13 f1
00000080 a3 30 7d c5 e2 0f 69 16 03 21 51 0e b5 d5 08 98
00000090 3e ca c5 22 5f b0 d4 3d 2e 78 11 92 99 66 24 5a
000000a0 56 96 74 41 cd 41 91 d4 02 65 ca 20 3e 1c a4 c1
000000b0 c9 b6 e9 aa 89 89 40 e4 66 c4 d4 3f 49 85 e5 66
000000c0 56 82 93 f9 94 87 15 9c 2f 46 08 30 01 79 28 e3
000000d0 41 e7 29 24 ad 21 0a 4b e0 79 ea 7f fd 4b ec 10
000000e0 a9 b8 23 96 69 17 a9 4e 8b 13 0d 5c 4c 28 28 f2
000000f0 ae e7 6e d8 e8 54 7e 15 da 51 2d 38 00 5f 59 26
~~~~~
```

Disassemble



```
10019fe: 74 10      je 0x1001a10
1001a00: 6a 10      push 0x10
1001a02: bf 98 18 00 01 mov edi,0x1001898
1001a07: 59         pop ecx
1001a08: 8b f0      mov esi,eax
1001a0a: 33 db      xor ebx,ebx
1001a0c: f3 a6      repz cmps BYTE PTR ds:[esi],BYTE PTR es:[edi]
1001a0e: 75 0a      jne 0x1001a1a
1001a10: 8b 45 08   mov eax,DWORD PTR [ebp+8]
1001a13: 8b c8      mov ecx,eax
1001a15: 8d 70 08   lea esi,[eax+8]
1001a18: eb 5c      jmp 0x1001a76
1001a1a: 6a 10      push 0x10
1001a1c: bf f8 18 00 01 mov edi,0x10018f8
1001a21: 59         pop ecx
1001a22: 8b f0      mov esi,eax
1001a24: 33 db      xor ebx,ebx
1001a26: f3 a6      repz cmps BYTE PTR ds:[esi],BYTE PTR es:[edi]
1001a28: 75 0a      jne 0x1001a34
1001a2a: 8b 45 08   mov eax,DWORD PTR [ebp+8]
1001a2d: 8b c8      mov ecx,eax
1001a2f: 8d 70 0c   lea esi,[eax+12]
1001a32: eb 42      jmp 0x1001a76
~~~~~
```



```
74 10
6a 10
bf 98 18 00 01
59
8b f0
33 db
f3 a6
75 0a
8b 45 08
8b c8
8d 70 08
eb 5c
6a 10
bf f8 18 00 01
59
8b f0
33 db
f3 a6
75 0a
8b 45 08
8b c8
8d 70 0c
eb 42
~ ~
```

Zap Address bytes



Word = N-Bytes of Abstracted Bytecode

# Malware Document: Mnemonics

```
00000000 3b 00 91 df 96 f6 33 73 7f f1 de 13 a2 8a 45 30
00000010 f6 01 ff e2 52 43 15 4e 1c a9 bf 9a 1c 41 8b 40
00000020 fa 14 30 24 2f ed bc 00 7d 46 4c 32 03 f2 ba 69
00000030 dd f5 28 87 84 20 61 f5 c9 3a 54 c2 98 9e c1 11
00000040 20 df 23 16 22 64 71 90 c1 2c 7c 1e 68 0e e2 28
00000050 66 b8 d2 05 2e e7 75 11 1b c8 4e 4c d4 9b 4a 8b
00000060 69 75 fb de 05 b3 4f f2 dc 26 04 4a 02 2a 2c 56
00000070 55 ef 93 07 e6 a3 2f 01 4a d9 75 3d b8 2b 13 f1
00000080 a3 30 7d c5 e2 0f 69 16 03 21 51 0e b5 d5 08 98
00000090 3e ca c5 22 5f b0 d4 3d 2e 78 11 92 99 66 24 5a
000000a0 56 96 74 41 cd 41 91 d4 02 65 ca 20 3e 1c a4 c1
000000b0 c9 b6 e9 aa 89 89 40 e4 66 c4 d4 3f 49 85 e5 66
000000c0 56 82 93 f9 94 87 15 9c 2f 46 08 30 01 79 28 e3
000000d0 41 e7 29 24 ad 21 0a 4b e0 79 ea 7f fd 4b ec 10
000000e0 a9 b8 23 96 69 17 a9 4e 8b 13 0d 5c 4c 28 28 f2
000000f0 ae e7 6e d8 e8 54 7e 15 da 51 2d 38 00 5f 59 26
.....
```

Disassemble

```
10019fe: 74 10
1001a00: 6a 10
1001a02: bf 98 18 00 01
1001a07: 59
1001a08: 8b f0
1001a0a: 33 db
1001a0c: f3 a6
1001a0e: 75 0a
1001a10: 8b 45 08
1001a13: 8b c8
1001a15: 8d 70 08
1001a18: eb 5c
1001a1a: 6a 10
1001a1c: bf f8 18 00 01
1001a21: 59
1001a22: 8b f0
1001a24: 33 db
1001a26: f3 a6
1001a28: 75 0a
1001a2a: 8b 45 08
1001a2d: 8b c8
1001a2f: 8d 70 0c
1001a32: eb 42
.....
```

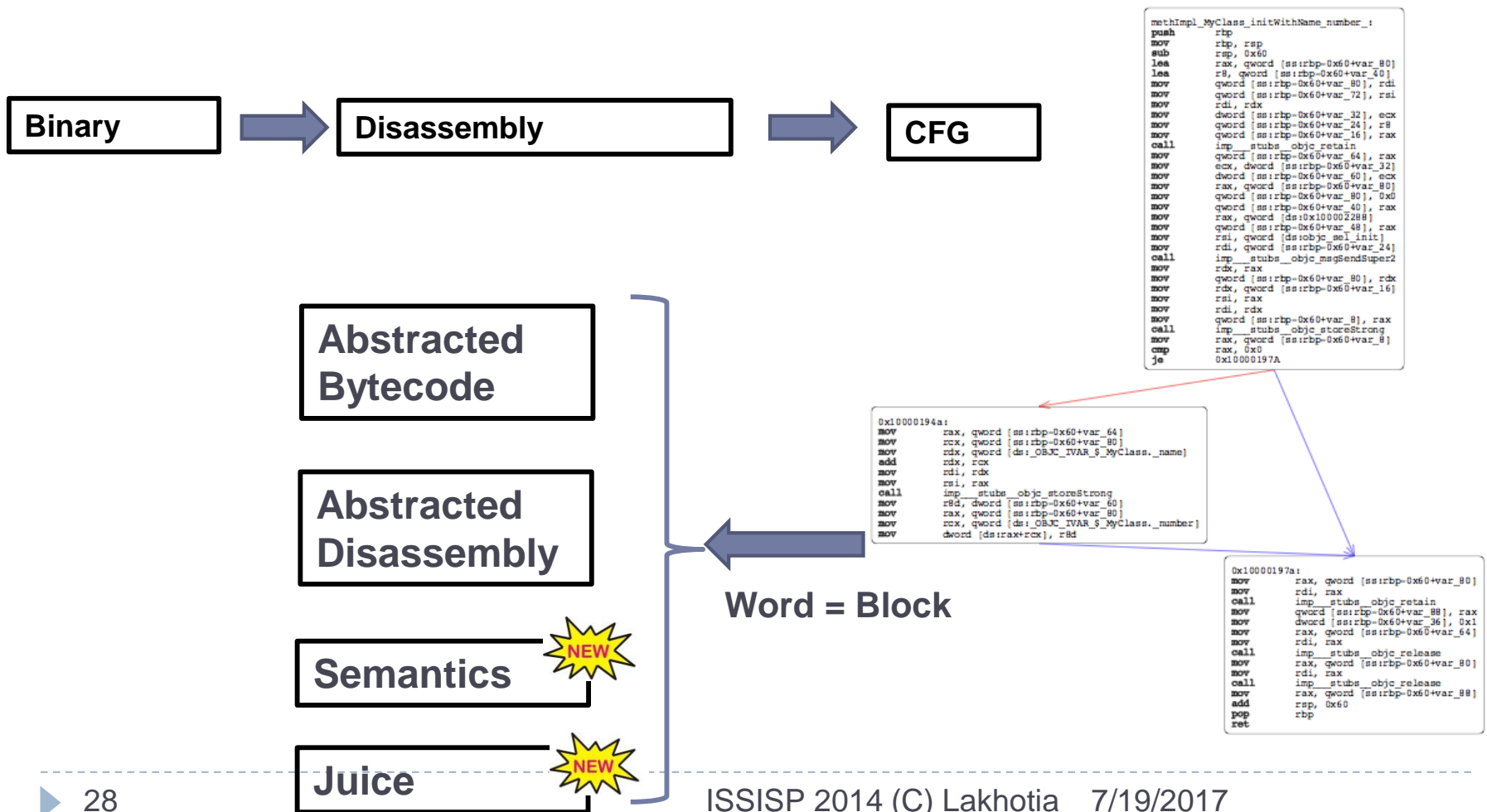
```
je 0x1001a10
push 0x10
mov edi,0x1001898
pop ecx
mov esi,eax
xor ebx,ebx
repz cmps BYTE PTR ds:[esi],BYTE PTR es:[edi]
jne 0x1001a1a
mov eax,DWORD PTR [ebp+8]
mov ecx,eax
lea esi,[eax+8]
jmp 0x1001a76
push 0x10
mov edi,0x10018f8
pop ecx
mov esi,eax
xor ebx,ebx
repz cmps BYTE PTR ds:[esi],BYTE PTR es:[edi]
jne 0x1001a34
mov eax,DWORD PTR [ebp+8]
mov ecx,eax
lea esi,[eax+12]
jmp 0x1001a76
.....
```

Word = N-mnemonic

(je push)  
(push mov)  
(mov pop)  
(pop xor)

Variation: N-perm

# Malware Document: using semantics



# Code to Semantics

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## Code

- Sequential
- Focus on operations

## Semantics

- Parallel
- Captures affect

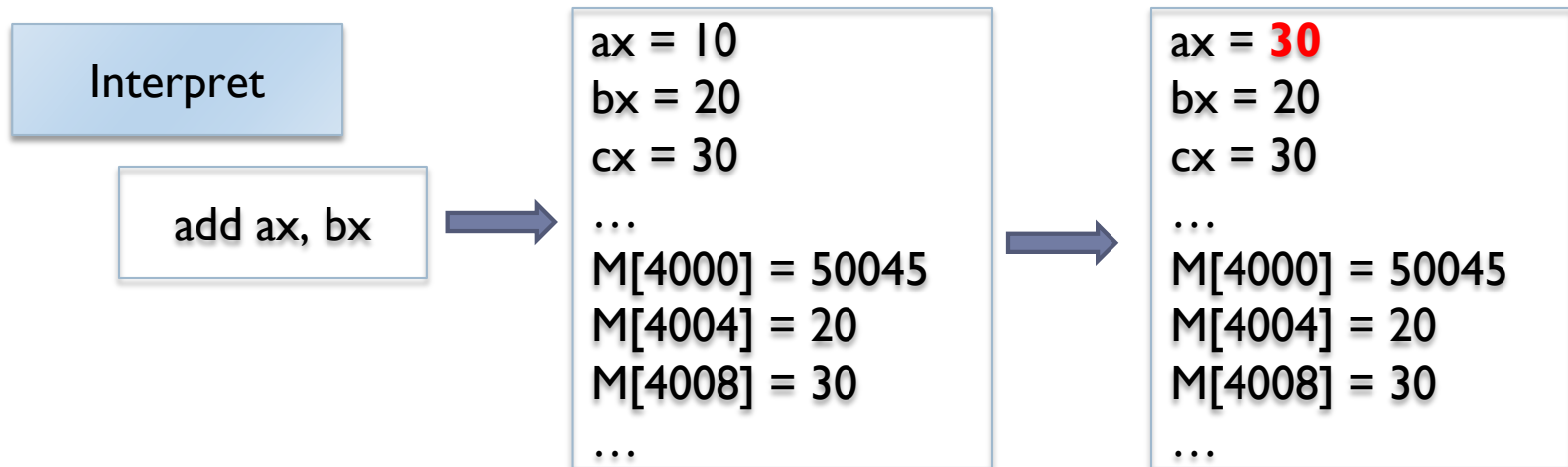
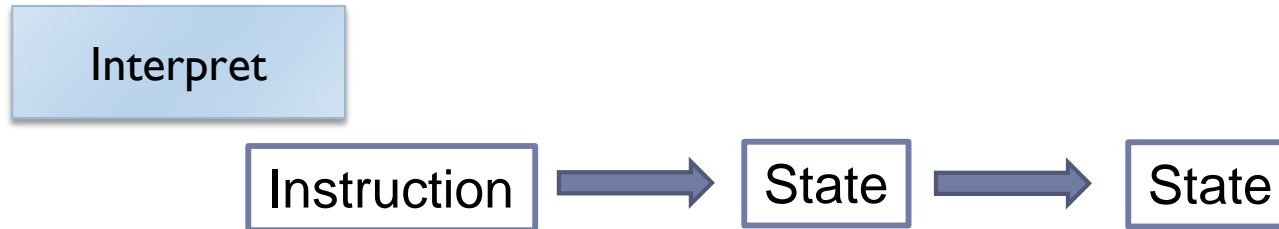
```
push ebp
mov  ebp,esp
sub  esp,4
mov  eax, DWORD ebp+4
mov  DWORD ebp+8,eax
mov  eax, DWORD ebp
mov  DWORD ebp-4,eax
```



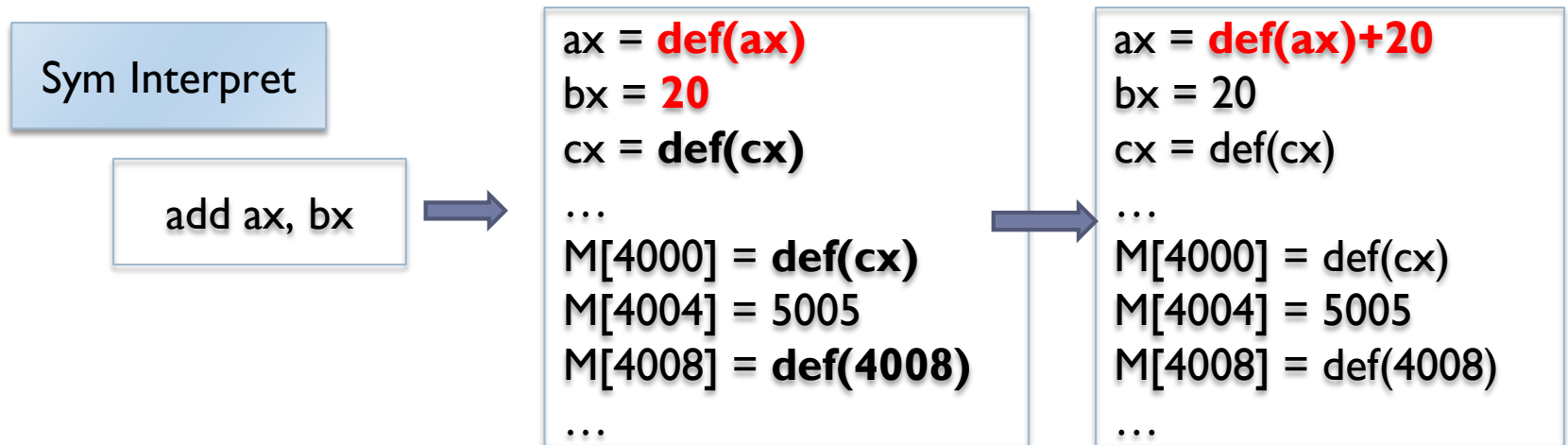
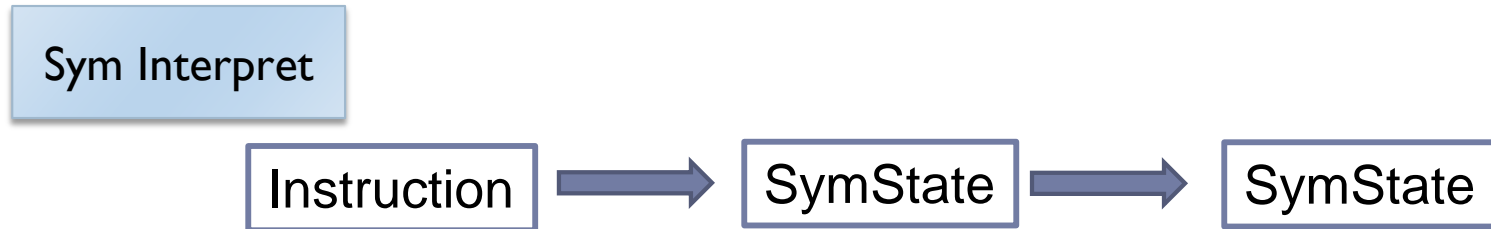
```
eax = def(ebp)
ebp = -4+def(esp)
esp = -8+def(esp)
memdw(-8+def(esp))= def(ebp)
memdw(-4+def(esp))= def(ebp)
memdw(4+def(esp)) = def(memdw(def(esp)))
```

# Concrete Semantics

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# Symbolic Semantics



# Symbolic Semantics: Formal Sketch

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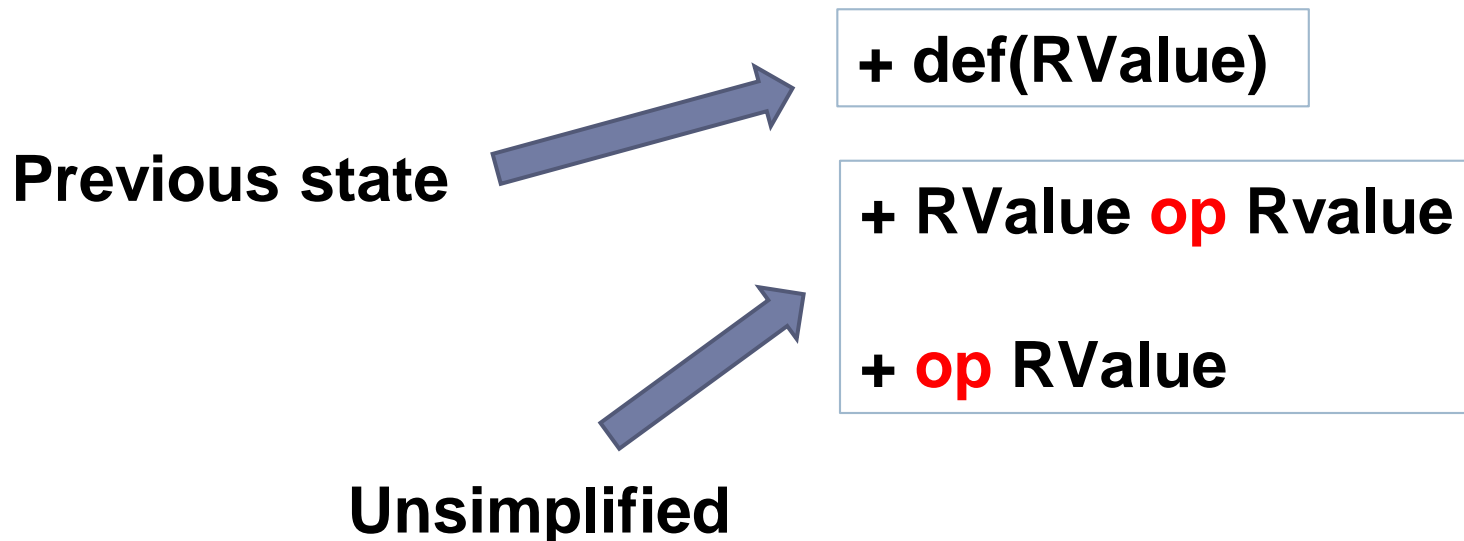
**Interpret:**  $\text{seq}(\text{Instruction}) \rightarrow \text{State} \rightarrow \text{State}$

*where:*

$\text{State} = \text{LValue} \rightarrow \text{RValue}$

$\text{LValue} = \text{Register} + \text{Mem}$

$\text{RValue} = \text{Number}$





# Algebraic Simplification

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▶ Num **op** Num  $\Rightarrow$  Num

▶ **op** Num  $\Rightarrow$  Num



**Evaluate**

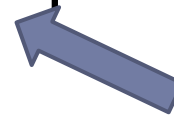
▶ Expr + Num  $\Rightarrow$  Num + Expr

▶ Expr \* Num  $\Rightarrow$  Num \* Expr



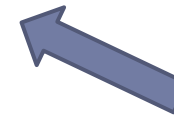
**Commute**

▶ Expr1 \* (Expr2 + Expr3)  $\Rightarrow$  Expr1 \* Expr2 + Expr1 \* Expr3



**Distribute**

▶ Expr1 **shift-right** Num  $\Rightarrow$  Expr1 \* 2^Num



**Equivalent**

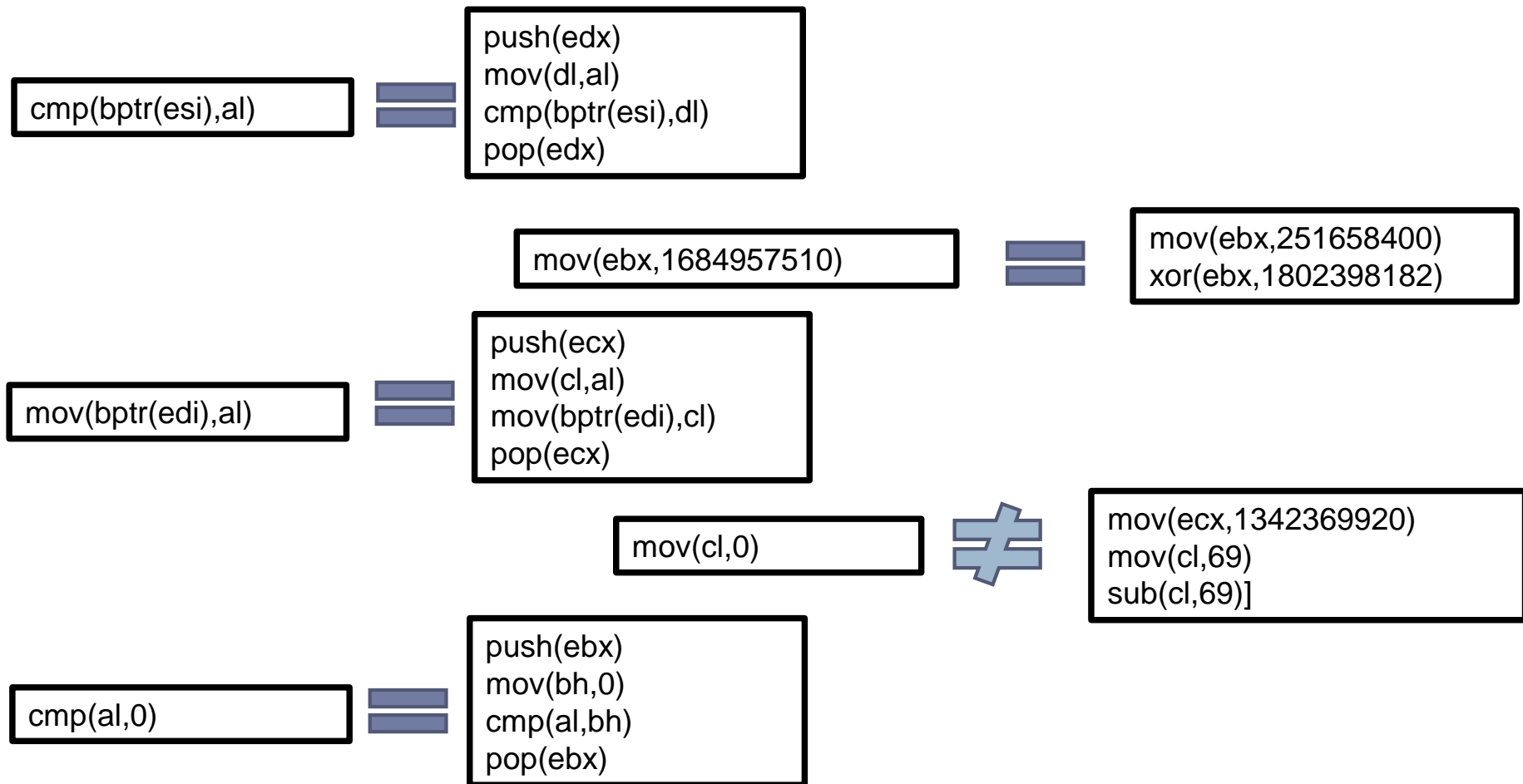
# Semantic matches

```
mov(ecx,ebp)
sub(ecx,63)
mov(dptr(ecx+59),eax)
pop(ecx)
lea(eax,wptr(ebp-28))
push(edi)
mov(edi,1148415812)
```



```
push(esi)
mov(esi,-1545600507)
or(ecx,esi)
pop(esi)
push(edi)
mov(edi,ebp)
mov(ecx,edi)
pop(edi)
push(eax)
mov(eax,63)
sub(ecx,eax)
pop(eax)
mov(dptr(ecx+59),eax)
pop(ecx)
lea(eax,wptr(ebp-28))
push(edi)
mov(edi,880280128)
push(esi)
mov(esi,268135684)
add(edi,esi)
pop(esi)
```

# Semantic matches



# Semantics to Word

```
esp = -8+def(esp)
eax = def(ebp)
memdw(-4+def(esp))= def(ebp)
memdw(4+def(esp)) = 20 + def(eax)
memdw(-8+def(esp))= def(ebp)
ebp = -4+def(esp)
```



**SORT**

```
memdw(-4+def(esp))= def(ebp)
ebp = -4+def(esp)
memdw(-8+def(esp))= def(ebp)
eax = def(ebp)
memdw(4+def(esp)) = def(eax) + 20
esp = -8+def(esp)
```



```
eax = def(ebp)
ebp = -4+def(esp)
esp = -8+def(esp)
memdw(-8+def(esp))= def(ebp)
memdw(-4+def(esp))= def(ebp)
memdw(4+def(esp)) = def(eax) + 20
```



**0da5678afdgh732**

```
eax = def(ebp)
ebp = -4+def(esp)
esp = -8+def(esp)
memdw(-8+def(esp))= def(ebp)
memdw(-4+def(esp))= def(ebp)
memdw(4+def(esp)) = def(eax) + 20
```



**0da5678afdgh732**

**HASH**

# Semantics to 'words'

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## ► Challenge:

- How to map equal semantics to the same 'word'?

## ► Solution:

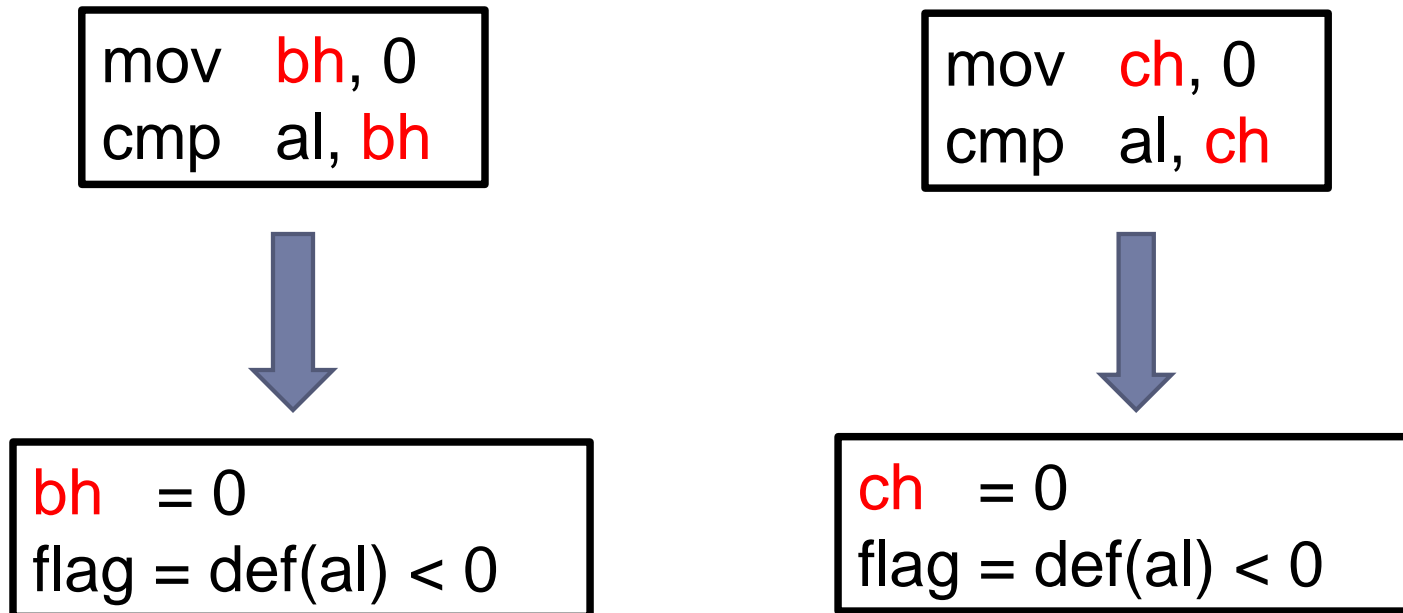
- Define canonical ordering
  - RValue structures are ground
  - Use ordering over symbols
  - Account for commutativity
  - Sum-of-product form
  - Simplify
- Word = Hash (md5, SHA1) of linearized semantics

RValue = Number  
+ **def(RValue)**  
+ **RValue op Rvalue**  
+ **op RValue**

# Limitations of (Block) Semantics

---

Should these be considered similar?



They produce different hash.  
Determining similarity would be expensive.

# Limitations of (Block) Semantics

---

## ▶ Does not capture:

- ▶ Register renaming
- ▶ Memory address reassignment
- ▶ Code motion between blocks
- ▶ Evolutionary changes
  - ▶ Hashes good for strict equality

## ▶ Solution:

- ▶ Generalize semantics
  - ▶ Juice
- ▶ Use n-Block semantics
- ▶ Use fuzzy hashes

# Generalized Semantics (aka Juice)

```
mov  bh, 0  
cmp  al, bh
```



```
bh  = 0  
flag = def(al) < 0
```

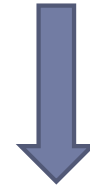


```
A  = N  
B = def(C) < N
```

```
mov  ch, 0  
cmp  al, ch
```



```
ch  = 0  
flag = def(al) < 0
```



```
A  = 0  
B = def(C) < N
```



# Generalized Semantics

## code

```
push ebp
mov ebp,esp
sub esp,4
mov eax, DWORD ebp+4
mov DWORD ebp+8,eax
mov eax, DWORD ebp
mov DWORD ebp-4,eax
```

## semantics

$eax = \text{def}(ebp)$   
 $ebp = -4 + \text{def}(esp)$   
 $esp = -8 + \text{def}(esp)$   
 $\text{memdw}(-8 + \text{def}(esp)) = \text{def}(ebp)$   
 $\text{memdw}(-4 + \text{def}(esp)) = \text{def}(ebp)$   
 $\text{memdw}(4 + \text{def}(esp)) = \text{def}(\text{memdw}(\text{def}(esp)))$

## gen\_semantics

$A = \text{def}(B),$   
 $B = N2 + \text{def}(C),$   
 $C = N2 + \text{def}(C),$   
 $\text{memdw}(E + \text{def}(C)) = \text{def}(B)$   
 $\text{memdw}(D + \text{def}(C)) = \text{def}(B)$   
 $\text{memdw}(F + \text{def}(C)) = \text{def}(\text{memdw}(\text{def}(C)))$   
where  $A, B, C$  are 'registers'  
 $N1$  and  $N2$  are 'Int'

- **Inductive Generalization**  
Replace registers and constants by variables

# Problem Hashing Juice

**eax = 20**

**ebx = 40**

$\text{mem}(\text{def}(\text{eax})) = \text{def}(\text{ebx}) + 30$

$\text{mem}(\text{def}(\text{ebx})) = \text{def}(\text{eax})$



R1 = N1

R2 = N2

$\text{mem}(\text{def}(\text{R1})) = \text{def}(\text{R2}) + \text{N3}$

$\text{mem}(\text{def}(\text{R2})) = \text{def}(\text{R1})$

**ebx = 40**

**ecx = 20**

$\text{mem}(\text{def}(\text{ebx})) = \text{def}(\text{ecx})$

$\text{mem}(\text{def}(\text{ecx})) = \text{def}(\text{ebx}) + 30$



R1 = N1

R2 = N2

$\text{mem}(\text{def}(\text{R1})) = \text{def}(\text{R2})$

$\text{mem}(\text{def}(\text{R2})) = \text{def}(\text{R1}) + \text{N3}$

Logically similar, but different hash

R1 = N1

R2 = N2

$\text{mem}(\text{def}(\text{R1})) = \text{def}(\text{R2}) + \text{N3}$

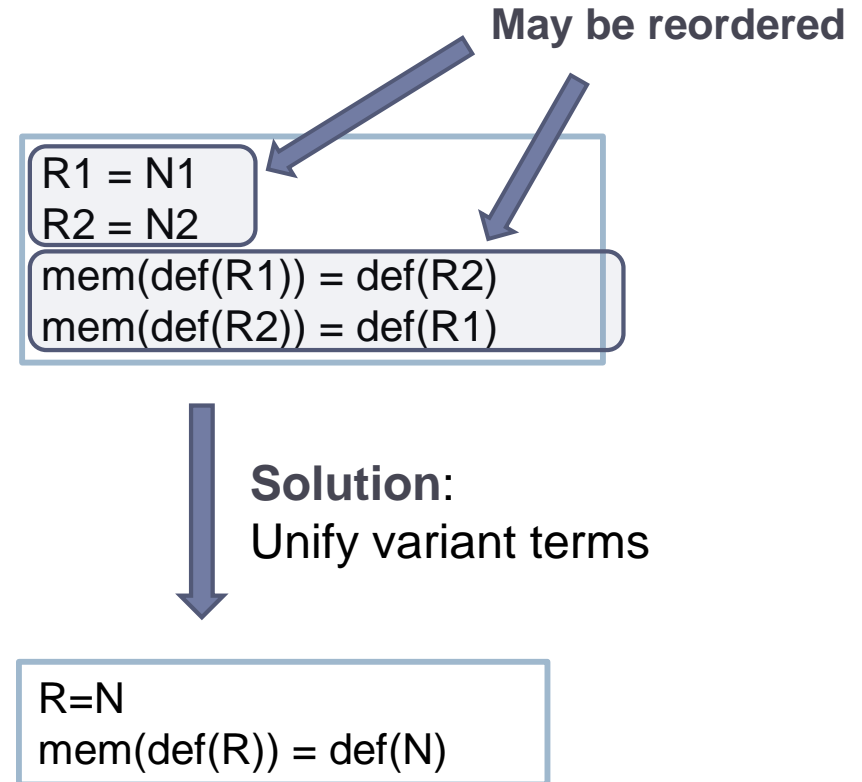
$\text{mem}(\text{def}(\text{R2})) = \text{def}(\text{R1})$

# Hashing Juice

## ► Challenge:

- Juice is non-ground
- Variables are unordered
- Similar juice may have different hash

JRValue = Number  
+ def(RValue)  
+ RValue op Rvalue  
+ op RValue  
+ **Variable**



# Juice after Unifying Variants

**eax = 20**

**ebx = 40**

$\text{mem}(\text{def}(\text{eax})) = \text{def}(\text{ebx}) + 30$

$\text{mem}(\text{def}(\text{ebx})) = \text{def}(\text{eax})$



$R1 = N1$

$R2 = N2$

$\text{mem}(\text{def}(R1)) = \text{def}(R2) + \mathbf{N3}$

$\text{mem}(\text{def}(R2)) = \text{def}(R1)$

**ebx = 20**

**ecx = 40**

$\text{mem}(\text{def}(\text{ebx})) = \text{def}(\text{ecx})$

$\text{mem}(\text{def}(\text{ecx})) = \text{def}(\text{ebx}) + 30$

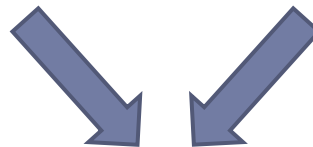


$R1 = N1$

$R2 = N2$

$\text{mem}(\text{def}(R1)) = \text{def}(R2)$

$\text{mem}(\text{def}(R2)) = \text{def}(R1) + \mathbf{N3}$



Loss of semantics, same hash

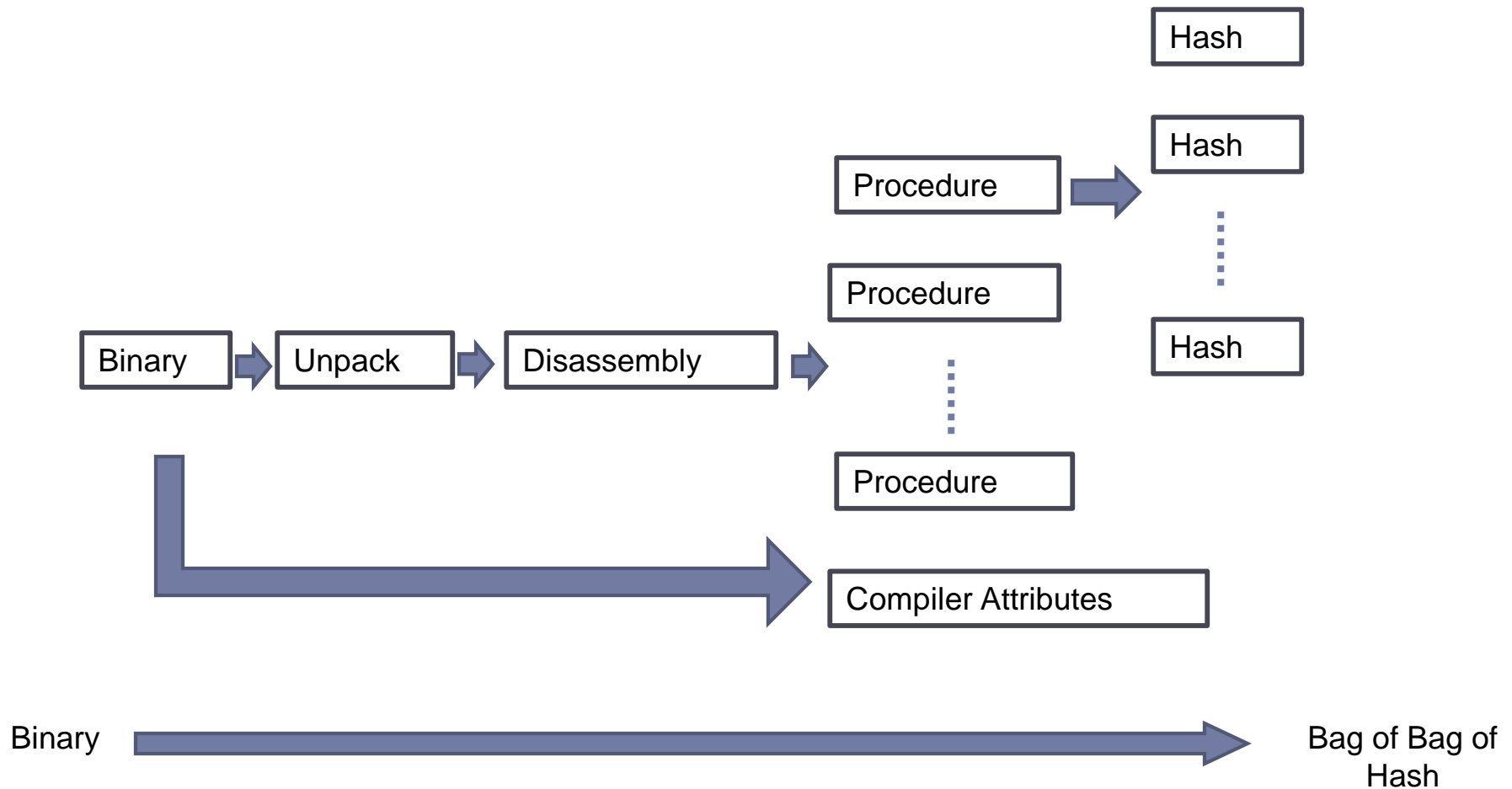
**dup(R1 = N1, 2)**

$\text{mem}(\text{def}(R1)) = \text{def}(R1)$

$\text{mem}(\text{def}(R1)) = \text{def}(R1) + \mathbf{N3}$

# Malware as Document

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# APPLICATION

# Cyber Threat Intelligence

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- ▶ “Network defense techniques
- ▶ that leverage knowledge about the adversaries
- ▶ and decrease an adversary’s likelihood of success”
- ▶ with each subsequent intrusion attempt.”

Cyber Squared Inc, 2013.

LEARN FROM AN ADVERSARY’S ATTEMPTS

# Malware Intelligence

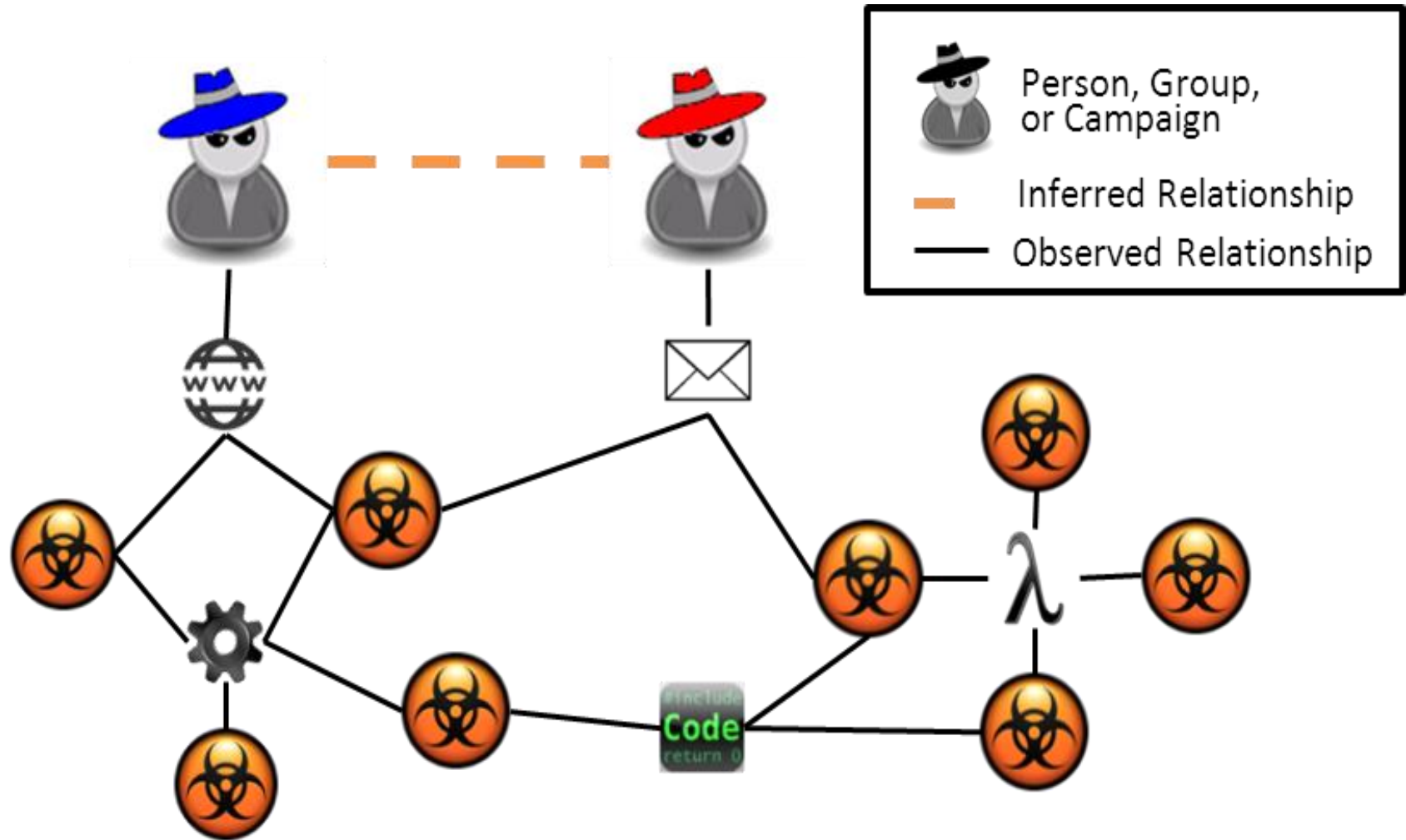
---

- ▶ MALWARE [ANALYSIS DRIVEN CYBER THREAT] INTELLIGENCE

LEARN FROM AN ADVERSARY'S MALWARE



# Connecting Actors from Malware



# Code connects Actors

The screenshot shows a Symantec Connect page. At the top is the Symantec logo and a search bar. Below is a navigation bar with 'COMMUNITY: Security', 'Blogs', and 'Security Response'. A welcome message follows. The main content area features a blog post titled 'W32.Duqu: The Precursor to the Next Stuxnet' by a Symantec Security Response employee, dated October 24, 2011. The post has 11 votes. Below the title is a 'Share' button and a Google+ share button. The text of the post discusses a research lab's findings on a threat named 'Duqu', comparing it to Stuxnet and noting that Duqu is essentially a precursor to a future Stuxnet-like attack.

Symantec. Connect

Enter keywords to search...

COMMUNITY: Security Blogs Security Response

Login or Register to participate

Welcome to the new look of Symantec Connect. [Click here](#) to find out what's changed.

## W32.Duqu: The Precursor to the Next Stuxnet

Updated: 24 Oct 2011 | Translations available: 日本語

Symantec Security Response SYMANTEC EMPLOYEE

+11  
11 Votes

Symantec. Official Blog

Share Share this on Google+ as Arur

On October 14, 2011, a research lab with strong international connections alerted us to a sample that appeared to be very similar to Stuxnet. They named the threat "Duqu" [dyū-kyū] because it creates files with the file name prefix "~DQ". The research lab provided us with samples recovered from computer systems located in Europe, as well as a detailed report with their initial findings, including analysis comparing the threat to Stuxnet, which we were able to confirm. Parts of Duqu are nearly identical to Stuxnet, but with a completely different purpose.

Duqu is essentially the precursor to a future Stuxnet-like attack. The threat was written by the same authors (or those that have access to the Stuxnet source code) and appears to have been created since the last Stuxnet file was recovered. Duqu's purpose is to gather intelligence data and assets from entities, such as industrial control system manufacturers, in order to more easily conduct a future attack against another third party. The attackers are looking for information such as design documents that could help them mount a future attack on an industrial control facility.

Stuxnet, Duqu, ... come from the same factory or factories

Stuxnet and Duqu were written on the same platform...by the same group of programmers.

... linked specific portions of code

# Case Study

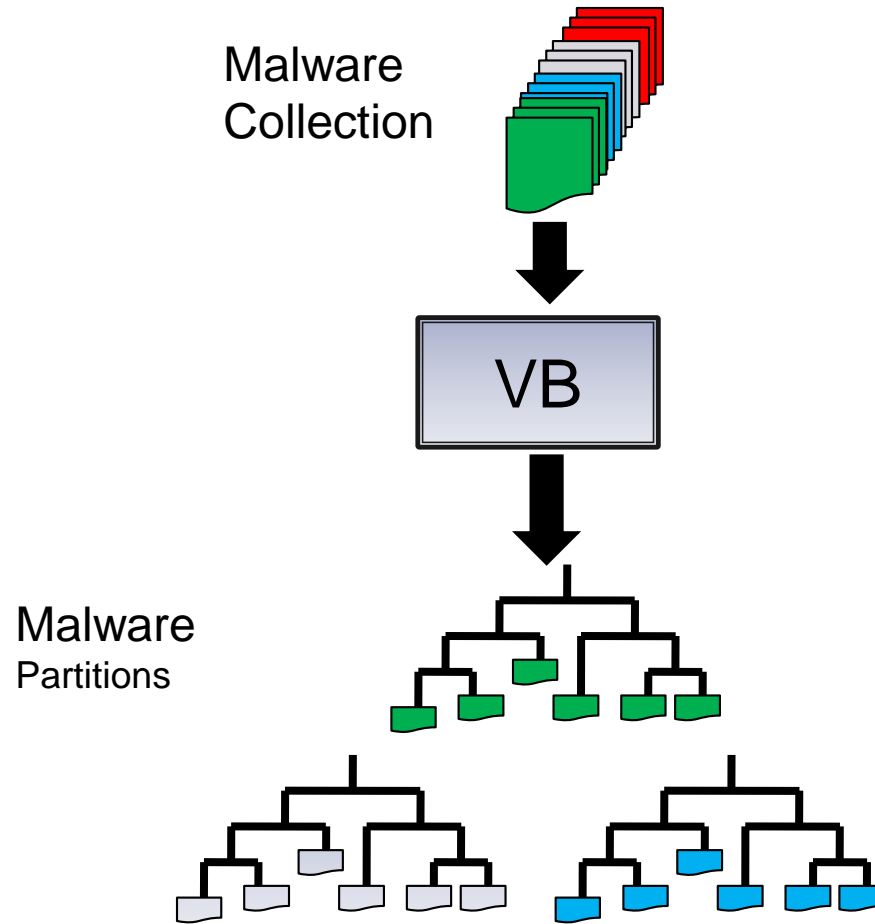
# Customer and Data

---

- ▶ **Financial Services company profile**
  - ▶ 120,000 servers, 60 countries
  - ▶ Have in-house, trained staff in malware analysis
  - ▶ Separate Security Op and Threat Investigation Op
- ▶ **Data**
  - ▶ Selection of 463 Binaries
  - ▶ VirusTotal first seen: Jun 2006 to April 2014
    - ▶ Unseen: 18 binaries
  - ▶ Size: 95 percentile – 700Kb

# Partition Collection

---



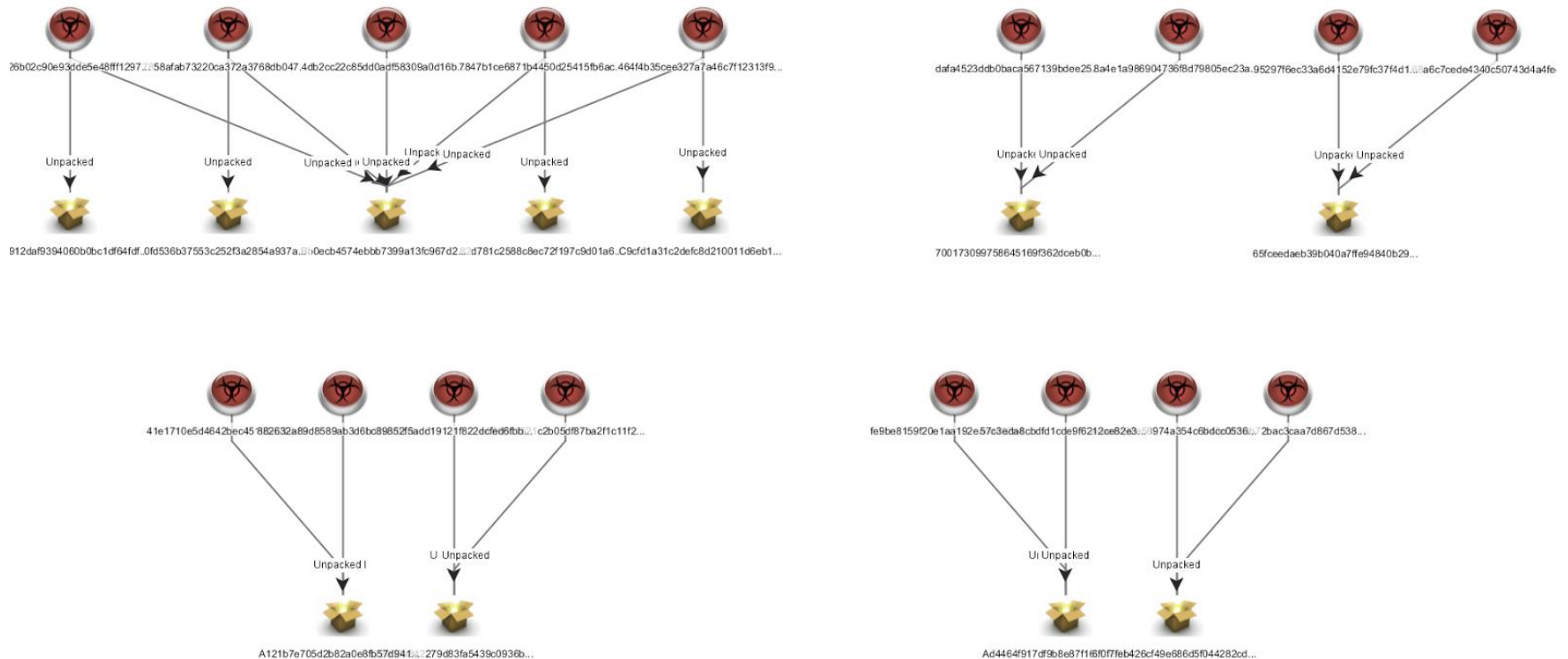
# Unpacking

---

- ▶ Our approach
  - ▶ Run program in a virtual machine
  - ▶ Watch it's execution below the VM (in emulator)
    - ▶ Program doesn't know it's being watched
  - ▶ Determine when it's completed unpacking
  - ▶ Create a PE executable from memory image

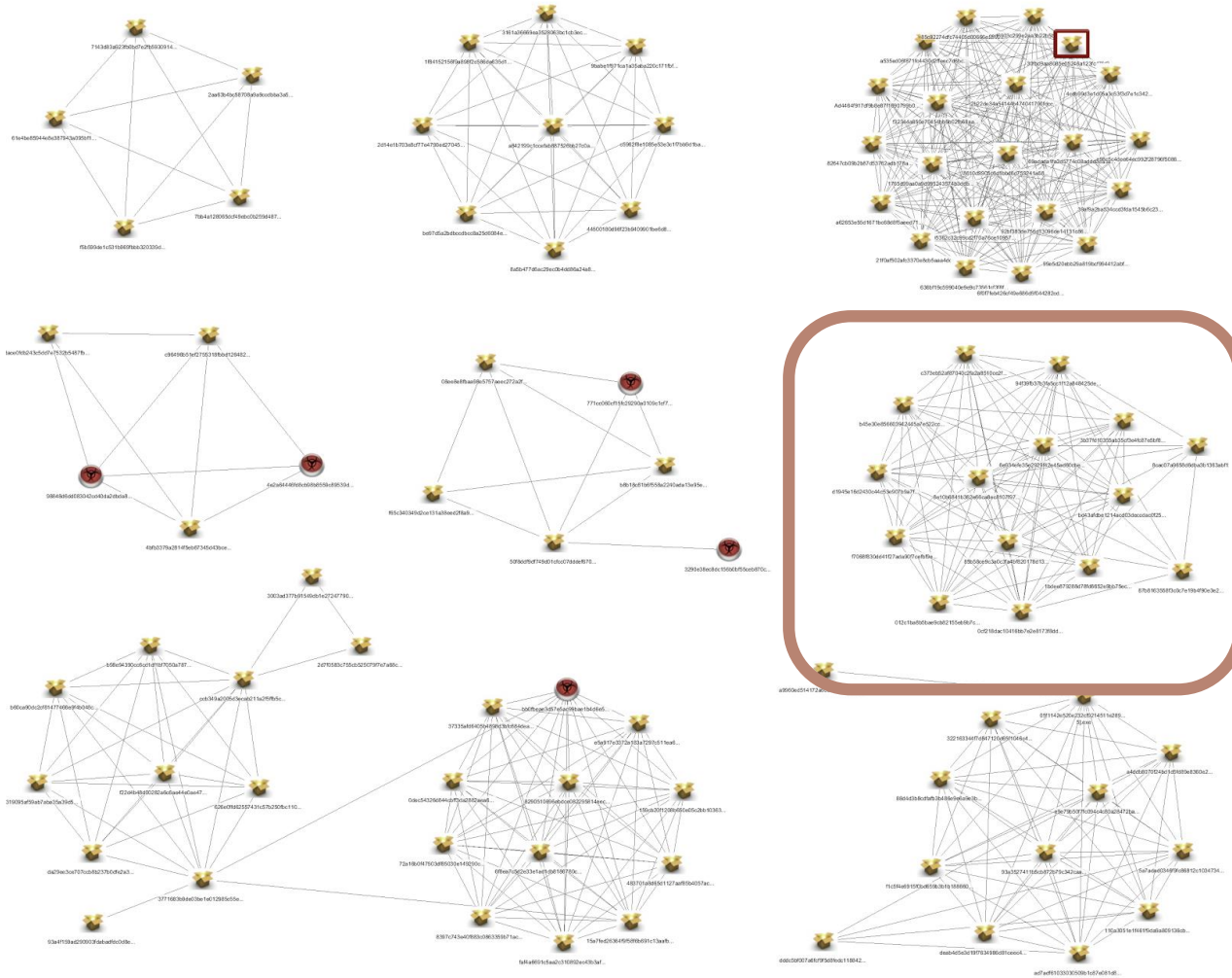
# Similar binaries after unpacking

Unpacked 371/463 binaries



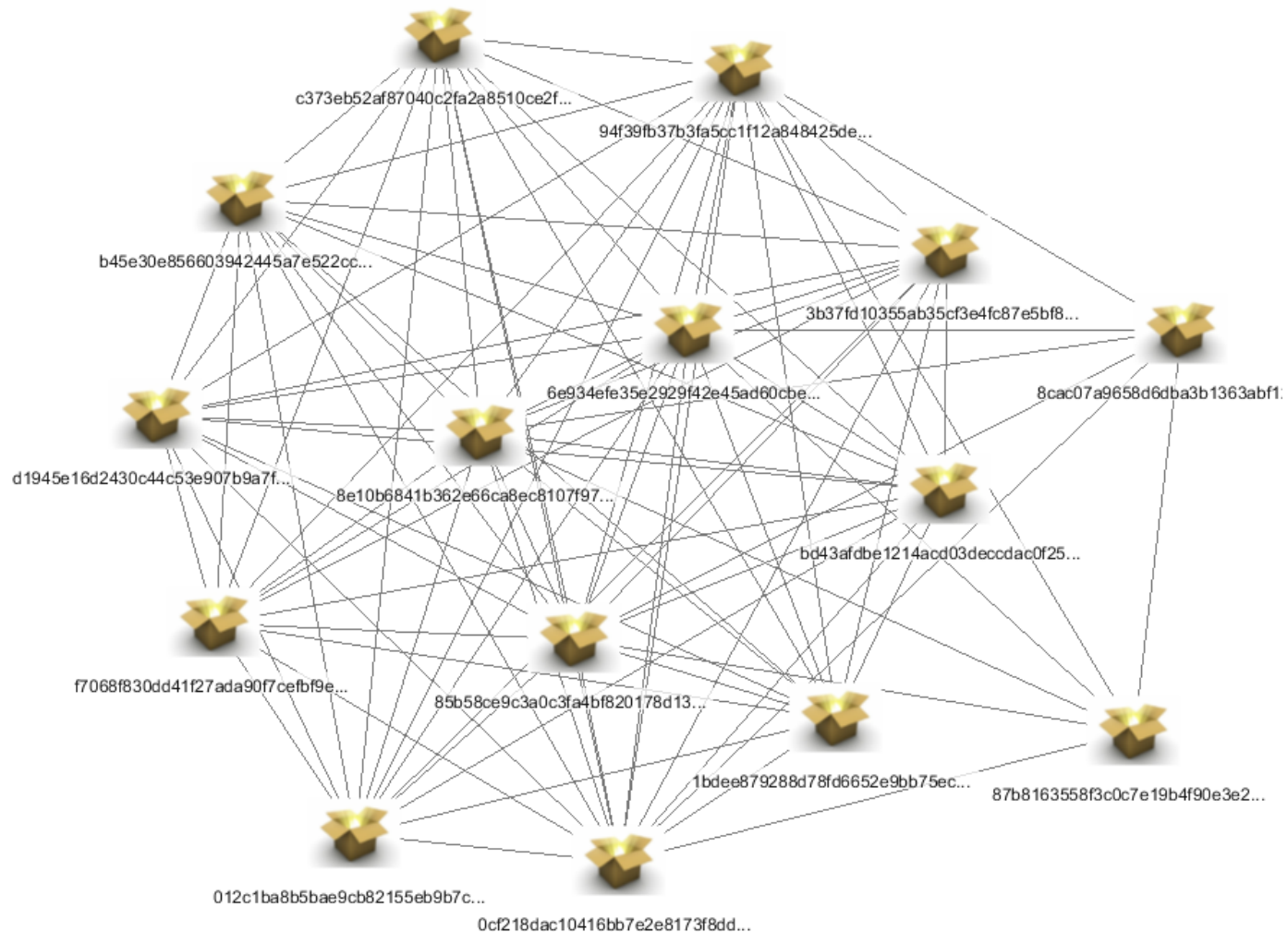
**Different Binaries mapped to same MD5 after unpacking**

# Case Study – Clusters found



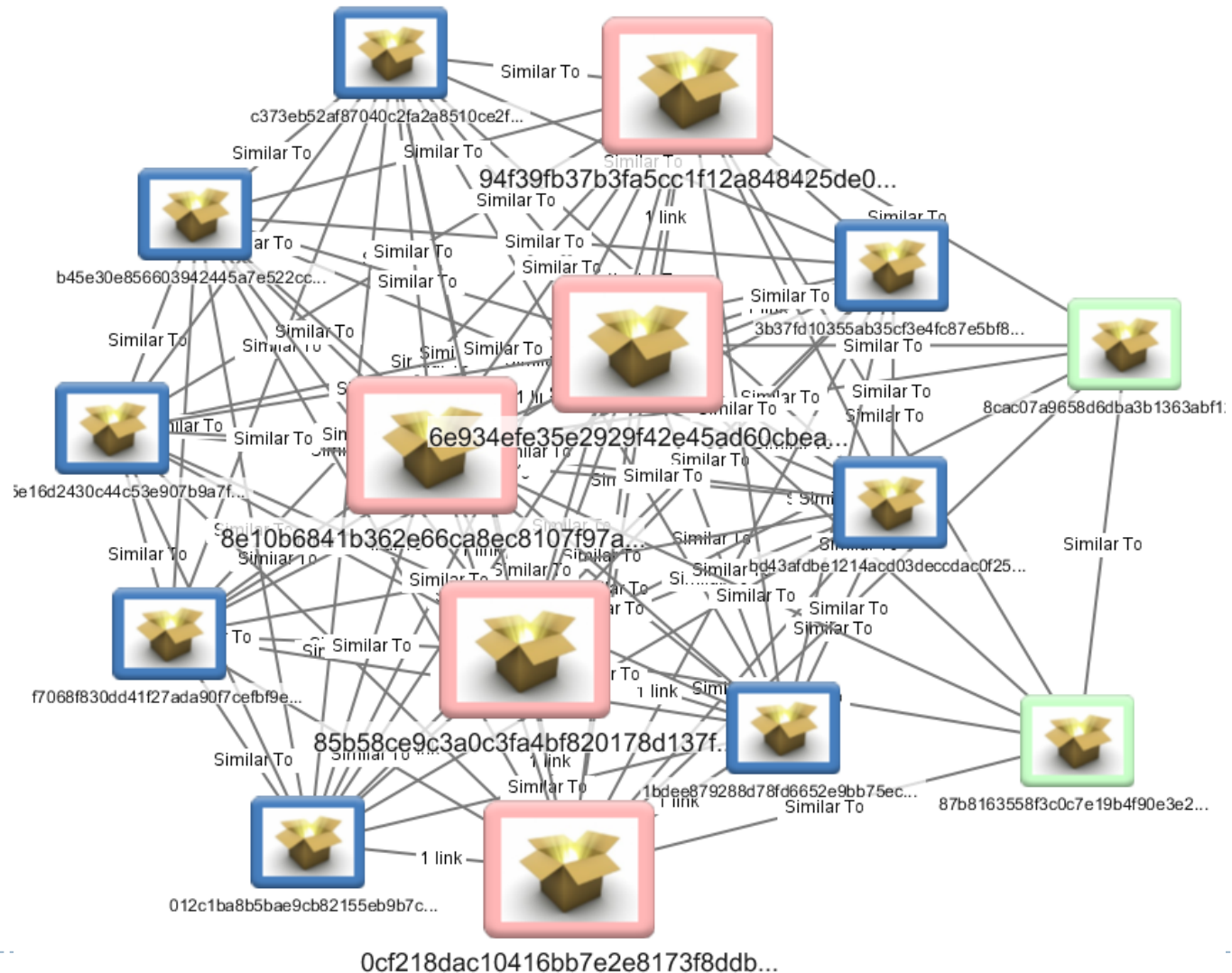


# Selected cluster





100101 2017 (0) EARTHQUAKE 11/10/2017

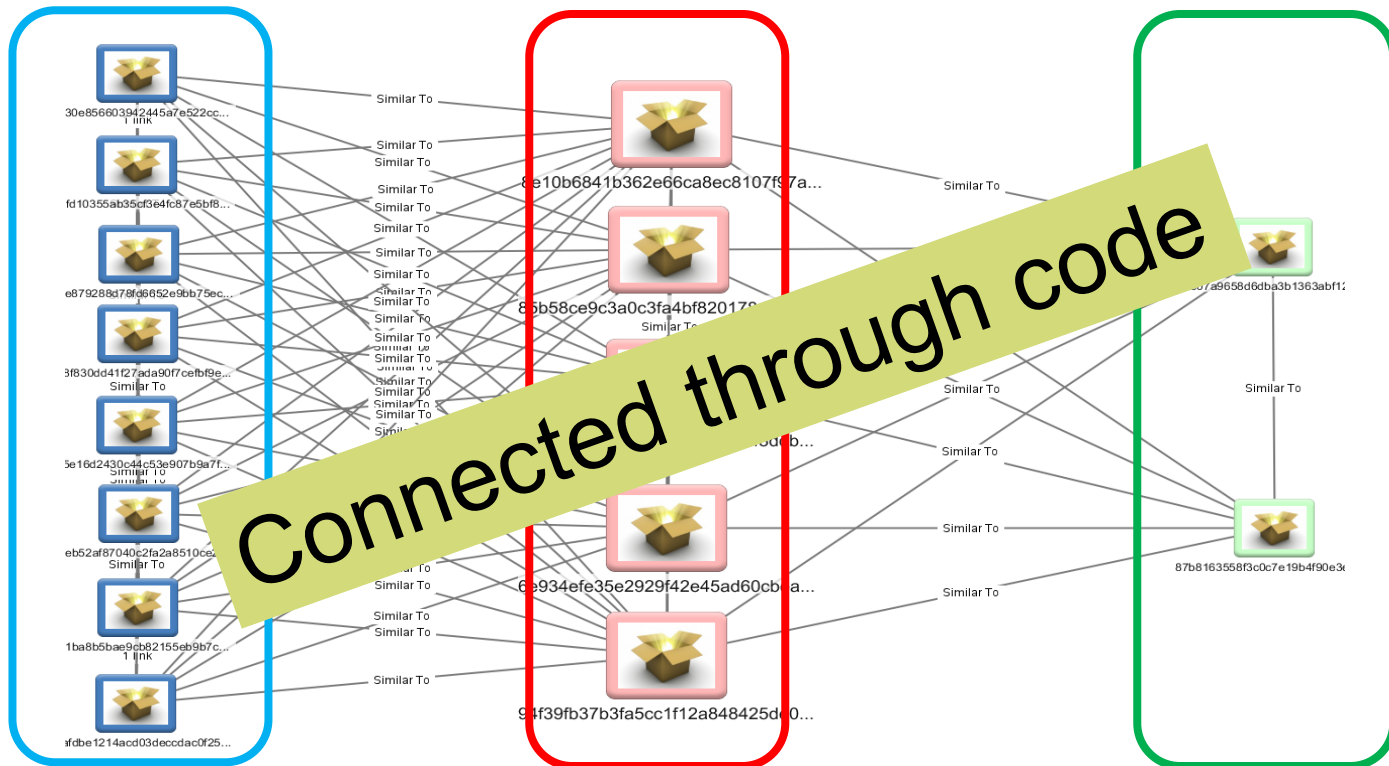


# Reorganize

**Memory Resident Worms,  
Backdoors**

**Adwares  
Trojan Downloaders**

**Keyloggers  
Password Stealers**



# Validation using Deep Inspection

# Validating Clusters using Bindiff

---

- ▶ Select a pair of binaries matched by VirusBattle
- ▶ Perform side-by-side-comparison using Zynamics' BinDiff.
  - ▶ BinDiff is an interactive tool for comparing two binaries.
  - ▶ In contrast, VirusBattle helps in locating similar binaries in a large collection.

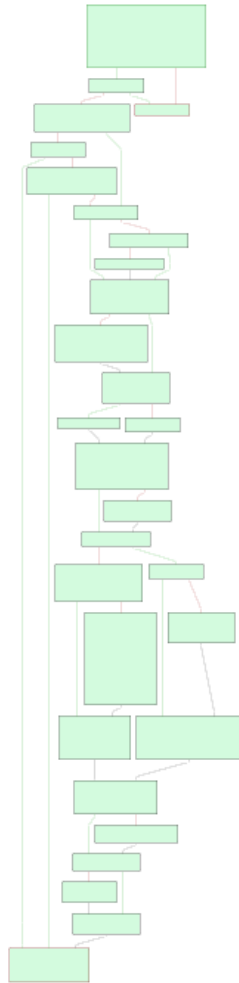
# Investigating matches in two binaries

similarity	EA primary	name primary		EA secondary	name secondary
0.99	00431CF4	sub_431CF4_22177	Procedures in one binary	00431524	sub_431524_24147
0.99	00431CC6	sub_431CC6_22176		004314F6	sub_4314F6_24146
0.99	00431C98	sub_431C98_22175	Matching procedures in second binary	004314C8	sub_4314C8_24145
0.99	00431C58	sub_431C58_22174		00431488	sub_431488_24144
0.99	00431C13	sub_431C13_22173		00431443	sub_431443_24143
0.99	00431BD4	sub_431BD4_22172		00431404	sub_431404_24142
0.99	00431B95	sub_431B95_22171		004313C5	sub_4313C5_24141
0.96	00431AFB	sub_431AFB_22170		0043132B	sub_43132B_24140
0.99	00431AAA	sub_431AAA_22168		004312DA	sub_4312DA_24138
0.90	00431A47	sub_431A47_22165		00431277	sub_431277_24135
0.90	00431A0D	sub_431A0D_22163		0043123D	sub_43123D_24133
0.99	0043196F	sub_43196F_22162		0043119F	sub_43119F_24132
0.99	00431920	sub_431920_22161		00431150	sub_431150_24131
0.99	004318C5	sub_4318C5_22160		004310F5	sub_4310F5_24130
0.99	0043186D	sub_43186D_22159		0043109D	sub_43109D_24129
0.99	00431824	sub_431824_22158		00431054	sub_431054_24128
0.99	004317D8	sub_4317D8_22157		00431008	sub_431008_24127
0.99	00431792	sub_431792_22156		00430FC2	sub_430FC2_24126
0.99	0043173E	sub_43173E_22155		00430F6E	sub_430F6E_24125
0.99	00431624	sub_431624_22154		00430E54	sub_430E54_24124
0.00	0043154E	sub_43154E_22153		00430D7E	sub_430D7E_24123

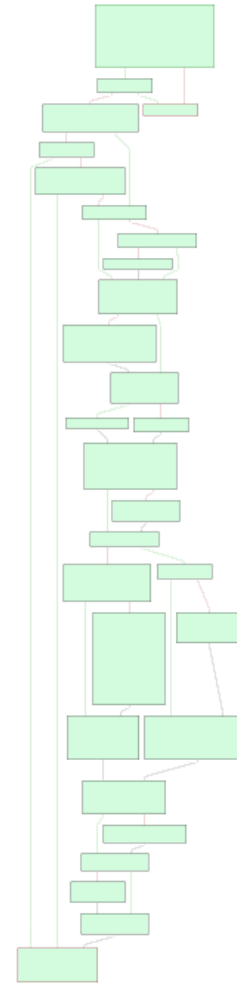
Level of  
similarity

# Drill down to matching two procedures

CFG of a  
procedure in  
one binary



CFG of a  
matching  
procedure in  
the second  
binary



# Drilldown to matching code







Closing...

# Summary

---

- ▶ **Malware Variant Generation Process**
  - ▶ Manual – usual lifecycle
  - ▶ Automated – for protection
- ▶ **Managing very large collection of malware**
  - ▶ Use information retrieval
  - ▶ Derive features from semantics
  - ▶ Normalize representation to enable string comparison
- ▶ **Semantic analysis**
  - ▶ Combine sound analysis (a la, compilers)
  - ▶ And unsound analysis (probabilistic)
- ▶ **Application**
  - ▶ Connect actors through shared code

# Selected References

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- ▶ LAKHOTIA, Arun, PREDA, Mila Dalla, et GIACOBAZZI, Roberto. Fast location of similar code fragments using semantic 'juice'. In : Proceedings of the 2nd ACM SIGPLAN Program Protection and Reverse Engineering Workshop. ACM, 2013. p. 5.
- ▶ DALLA PREDA, Mila, GIACOBAZZI, Roberto, LAKHOTIA, Arun, et al. Abstract symbolic automata: Mixed syntactic/semantic similarity analysis of executables. In : ACM SIGPLAN Notices. ACM, 2015. p. 329-341.
- ▶ MILES, Craig, LAKHOTIA, Arun, LEDOUX, Charles, et al. VirusBattle: State-of-the-art malware analysis for better cyber threat intelligence. In : *Resilient Control Systems (ISRCs), 2014 7th International Symposium on*. IEEE, 2014. p. 1-6.
- ▶ RUTTENBERG, Brian, MILES, Craig, KELLOGG, Lee, et al. Identifying shared software components to support malware forensics. In : *International Conference on Detection of Intrusions and Malware, and Vulnerability Assessment*. Springer, Cham, 2014. p. 21-40.