# Dynamic Program Analyses and Their Security Applications

Xiangyu Zhang





# What is Dynamic Program Analysis

- Dynamic analysis analyzes program execution
  - Examples
    - Identify the sequence of instructions that get executed
    - Identify the set of values that a variable holds during its lifetime
    - Identify the set of memory addresses/files that are accessed
  - Static analysis analyzes programs without executing them
    - Identify loops in the program
    - Generate control flow graph
    - Identify code clones
    - Static tainting



# Applications of Dynamic Analysis

- Software engineering
  - Debugging: what is the root cause that leads to an observed program failure?
  - Software optimization
  - Software validation
- Security
  - Anomaly detection
  - Forensic analysis
  - Expose hidden malicious logic



### Outline

#### **Temporal Dynamic Analysis:**

analyze program execution history

- 1. Attack investigation
- 2. Application vetting

#### **Spatial Dynamic Analysis:**

analyze a snapshot of program execution state

3. Memory forensics

**Dynamic Analyses** 



### Outline

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**Dynamic Analyses** 



### Cyberattacks are becoming more sophisticated

Advanced Persistent Threat (APT)

Targeted: Targets specific organizations to exfiltrate information or disrupt the systems.

Infrastructure (Nuclear plants)

Business
(Target® Data Breach)

Government (OPM: Office of Personnel Management)

Politics (DNC email hack)











#### Multiple stages of APTs



1. Reconnaissance: Learn the target organization



**2. Infiltration**: Enter into the victim via social-engineering (e.g., phishing emails) or vulnerabilities



3. Discovery and capture: Stay low and operate slowly to avoid detection while discovering critical machines and/or information.



4. Exfiltration/Disruption: Send the captured secret information to attackers or destroy the systems



### Combatting APTs is challenging



3. Discovery and capture: Stay low and operate slowly to avoid detection while discovering critical machines and/or information.

#### (Whitelisted) benign built-in software

APT actors often leverage benign built-in software (e.g., web-browsers and email clients that are already whitelisted) to avoid detection

#### Low and slow (Stealthy)

Incidents are often detected after a few months.



- Audit logging records system level events during system execution
  - For attack investigation: forensic analysis
    - Identify the source of an attack
    - Understand the damage to a victim system





Analyze audit logs to generate a causal graph

```
(1) Proc_A recv <x.x.x.x>
(2) Proc_A fork Malware

Audit Log
```



- Analyze audit logs to generate a causal graph
  - Backward analysis identify the source of an attack

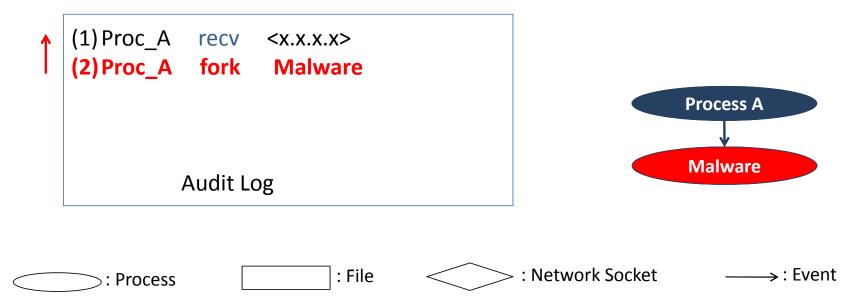
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Audit Log
```

: Process : File : Network Socket →: Event

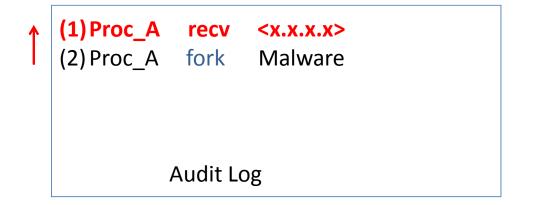


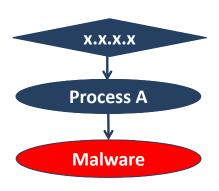
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- Analyze audit logs to generate a causal graph
  - Backward analysis identify the source of an attack



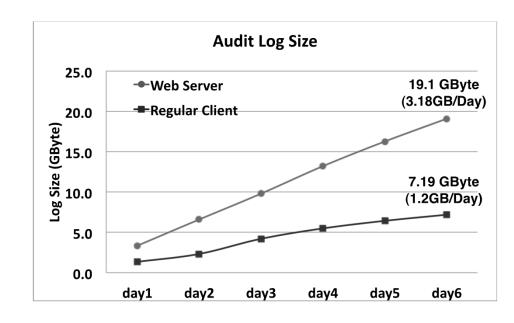


 $\bigcirc$ : Process  $\bigcirc$ : File  $\bigcirc$ : Network Socket  $\longrightarrow$ : Event



# Limitations of Traditional Audit Logging

- Dependence explosion problem
  - Long running programs generate a lot of system level dependences during their lifetime
- High overhead
  - Linux Audit Framework: ~40%run time slow down
  - Space overhead





# Dependence Explosion - Example

Social engineering attack by phishing e-mail



From: Chase Online [mailto:smrfs@chaseonline.com]

Sent: Wednesday, July 11, 2012 8:27 PM Subject: Verification of Recent Activities Required



#### • Social engil

#### URGENT: Verification of Recent Activities Required Your Chase Bank Account

Dear Customer:

As part of our ongoing effort to protect your account and our relationship, we monitor your account for possible fraudulent activity. We need to confirm that you or someone authorized to use your account made the following sign in error attempt on your Chase Bank account:

- Sign in Error Attempt was noticed and registered at 70.43.95.130. Chantilly, Virginia United State on or around 2012-07-11 at 05:01AM.
- Sign in Error Attempt was noticed and registered at 68.170.136.81. Commack, New York United State on or around 2012-07-11 at 8:30PM.
- Sign in Error Attempt was noticed and registered at 74.11.185.43 Delray Beach, Florida United State on or around 2012-07-11 at 8:20PM.
- Sign in Error Attempt was noticed and registered at 68.46.148.86, Egg Harbor Township, New Jersey, United States on or around 2012-07-11 at 6:39AM.

Please click on the link below to sign in correctly to reactivate your online banking access:

www.chase.com

Your satisfaction is important to us, and we appreciate your prompt attention to this matter. If you already had the opportunity to discuss this matter with us, please disregard this message.

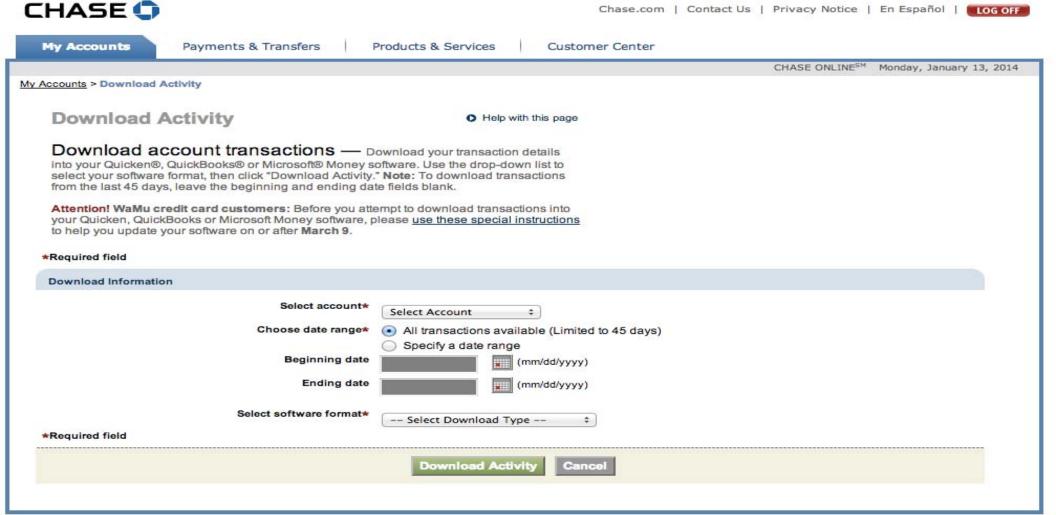
Thank you for being our customer.

Sincerely,

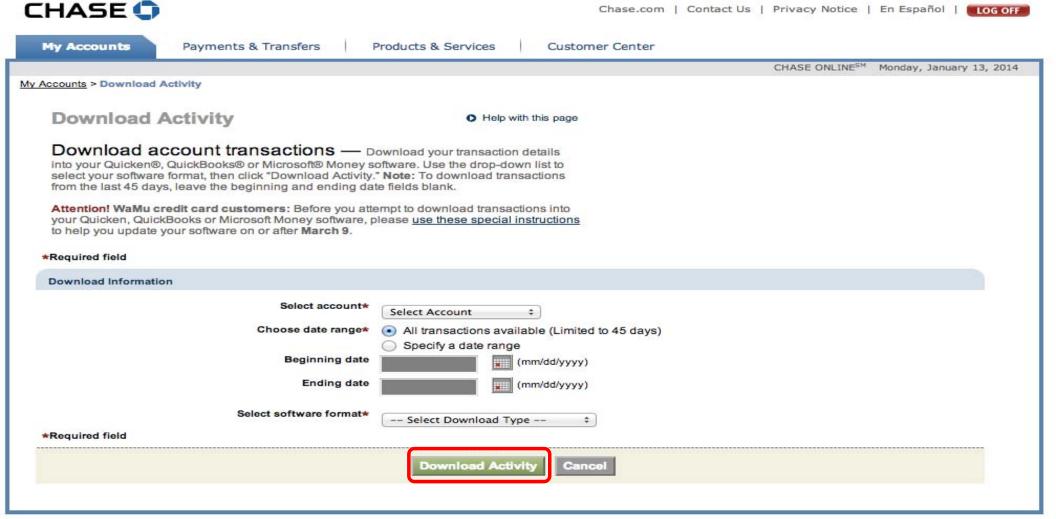
Christopher J. Palumbo Senior Vice President Chase Fraud Prevention











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My Accounts Payments & Transfers Products & Services Customer Center CHASE ONLINE<sup>SM</sup> Monday, January 13, 2014 My Accounts > Download Activity **Download Activity** Download account trans into your Quicken®, QuickBooks® or I select your software format, then click from the last 45 days, leave the begin Attention! WaMu credit card custom your Quicken, QuickBooks or Microso to help you update your software on o \*Required field **Download Information** Selec \*Required field



How should I answer?

Clean

Ignore ▼

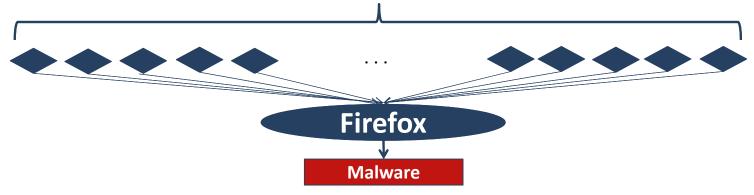
Malware

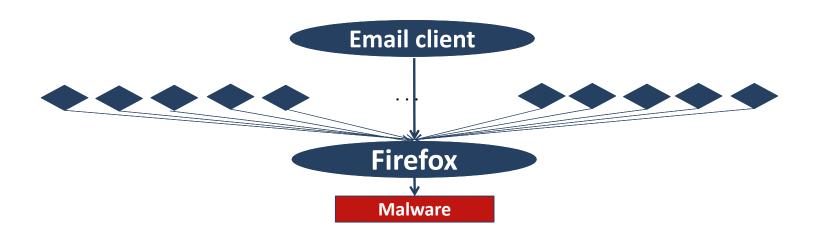


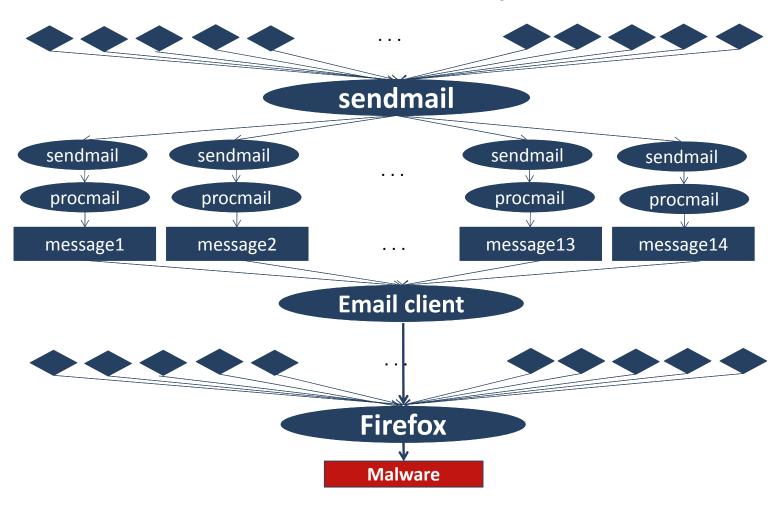
The user visited 11 web sites

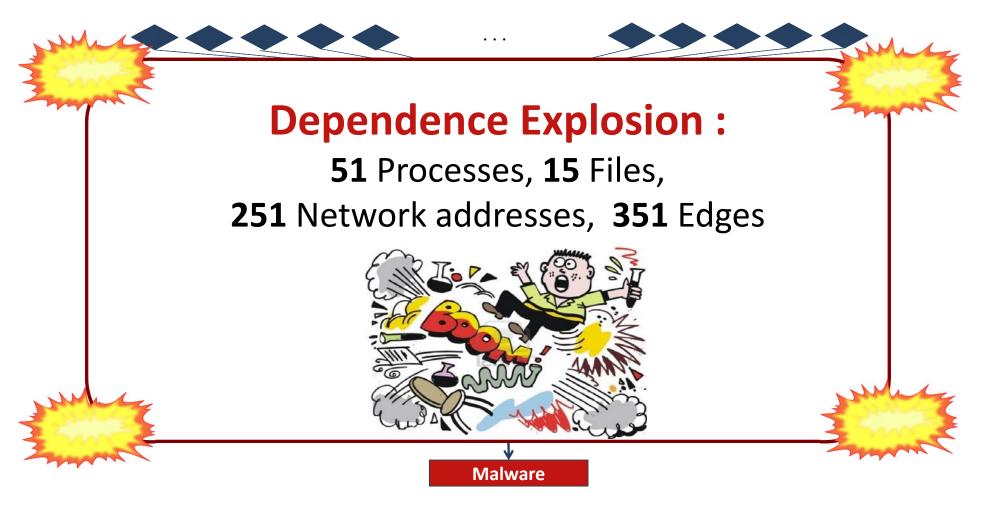
Dependence explosion!!

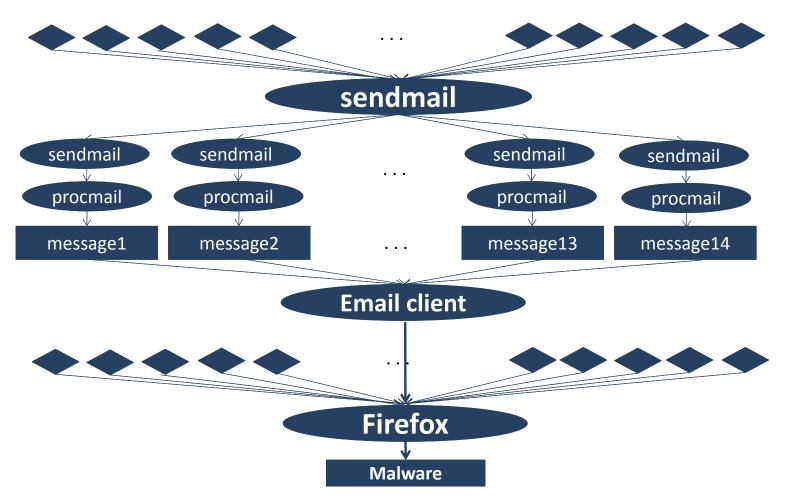
(229 IP Addresses)

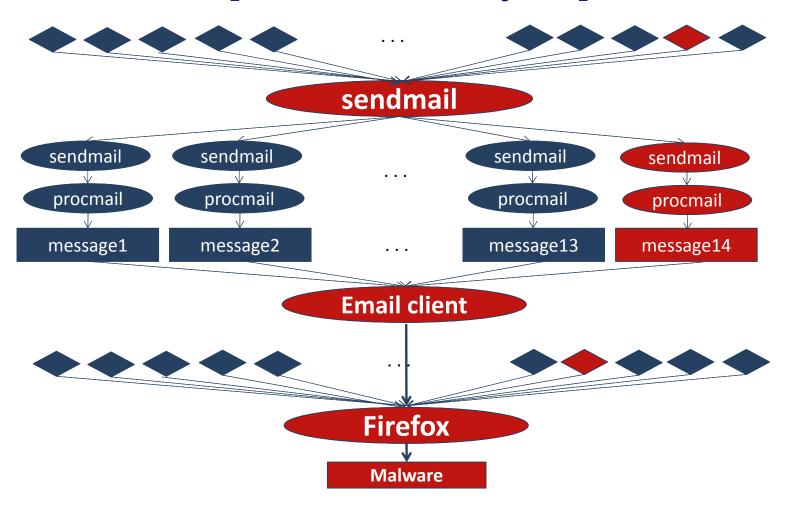








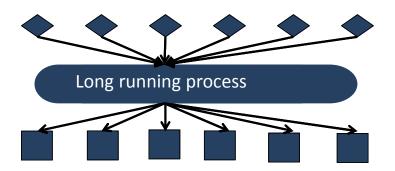






# Dependence Explosion – Root Cause

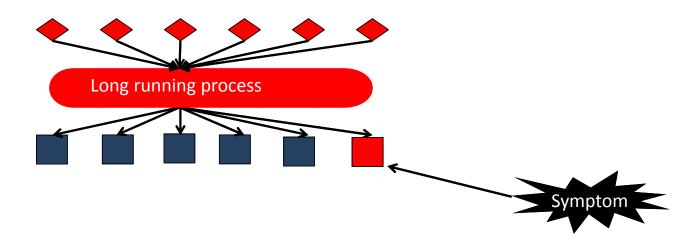
- Caused by long-running processes
  - Receive many inputs and produces many outputs





# Dependence Explosion – Root Cause

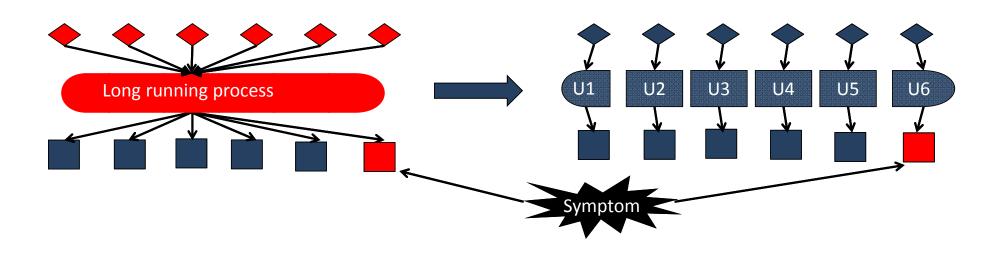
- Caused by long-running processes
  - Receive many inputs and produces many outputs
  - Any output is potentially related to all preceding inputs





#### **BEEP: Binary-based Execution Partition**

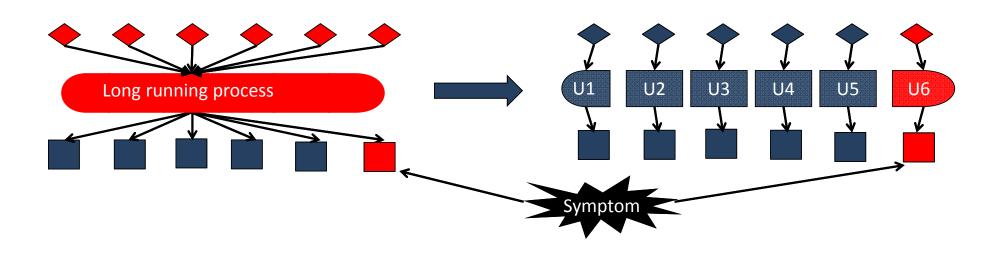
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  - Dynamically partition the execution of a process into autonomous execution segments





#### **BEEP:** Binary-based ExEcution Partition

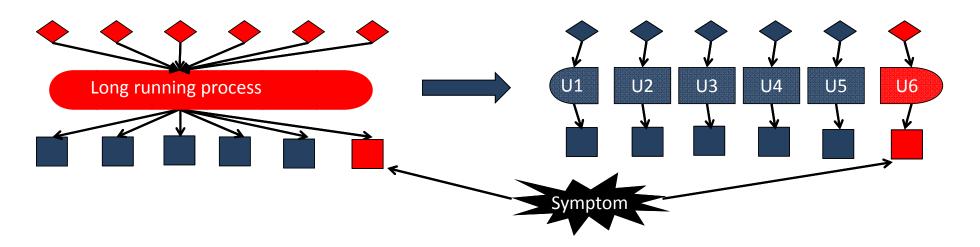
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#### **BEEP**: Binary-based ExEcution Partition

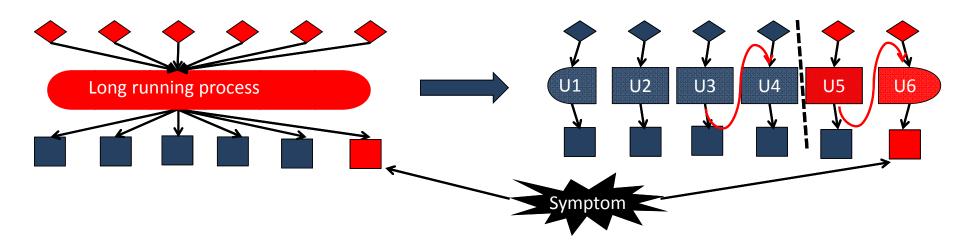
- Finer-grained subject : Execution "UNIT"
  - Dynamically partition the execution of a process into autonomous execution segments
  - Units are not always independent
    - Detect causality between units

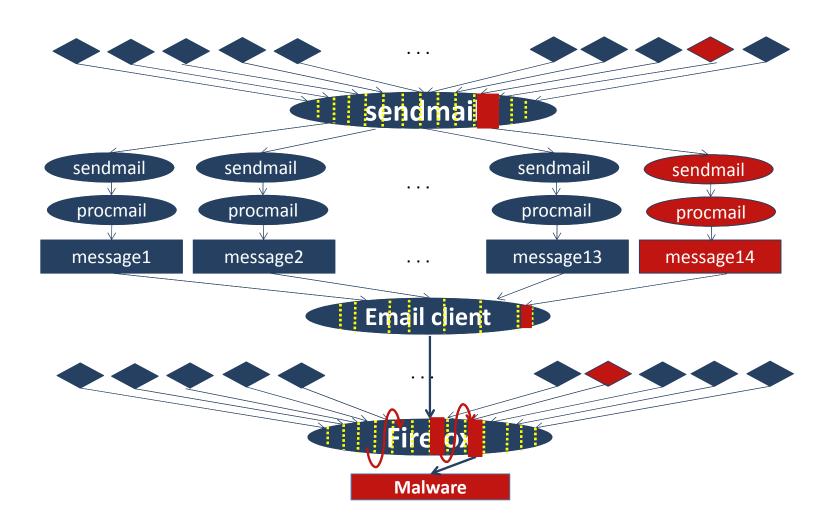


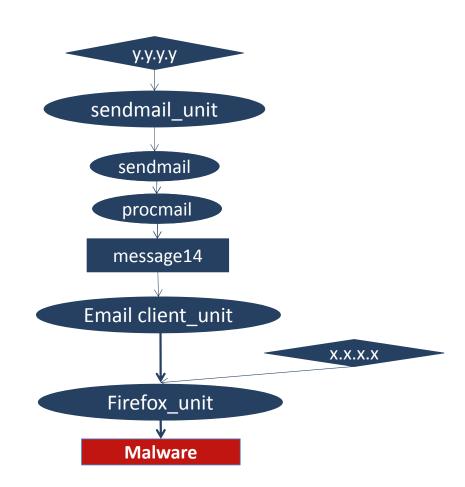


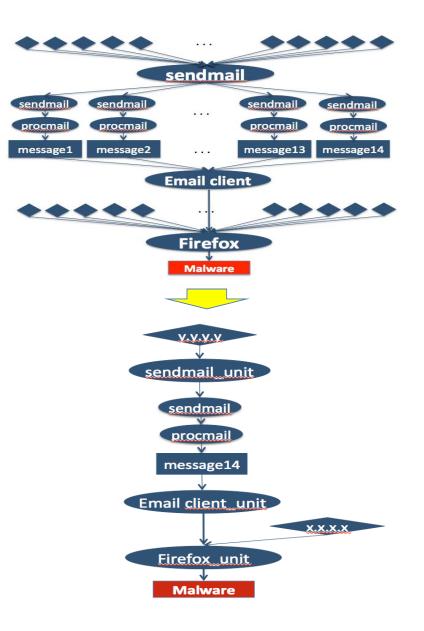
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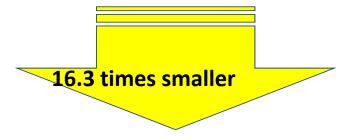








Previous approaches [SOSP'03, SOSP'05]:
51 Processes, 15 Files,
251 Network addresses, 351 Edges



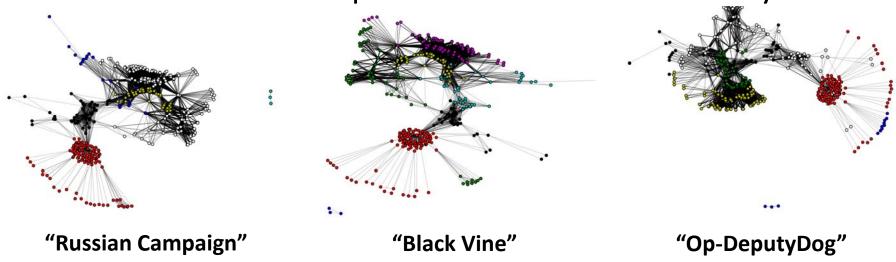
#### **BEEP:**

10 Processes, 2 Files,6 Network addresses, 23 Edges



### **Evaluation on Real APT Attacks**

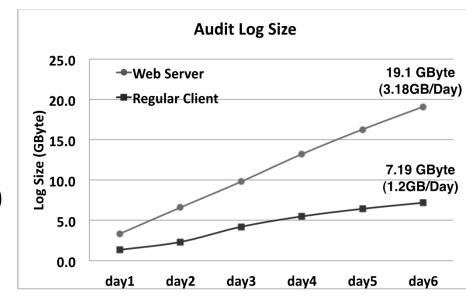
- Reproduce about 15 real attacks
- Our graphs are usually one-two orders of magnitude smaller, and cover whole attack paths with over 90% accuracy.

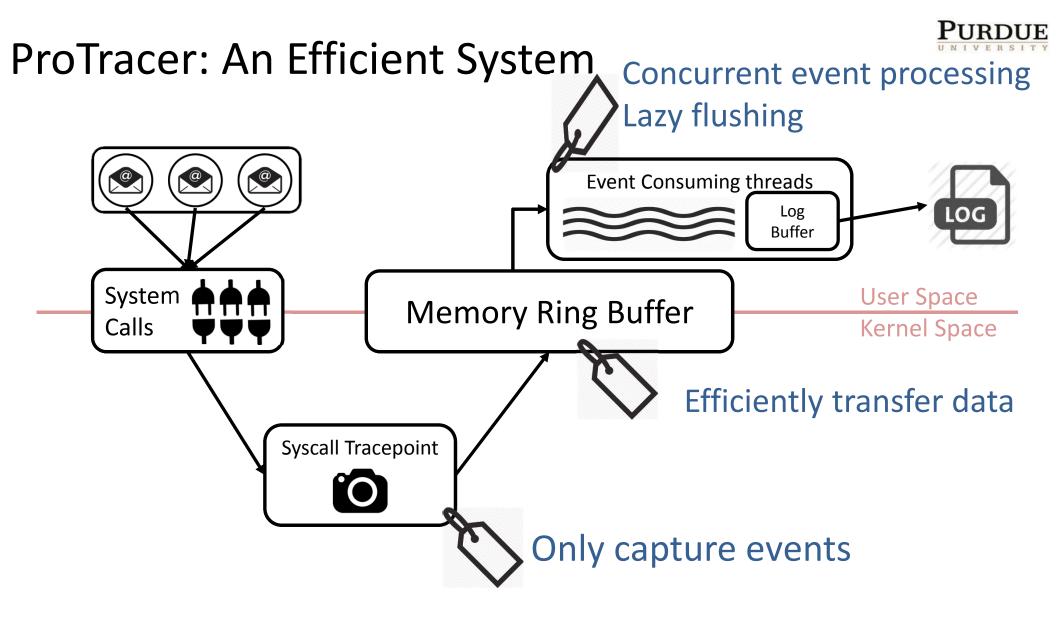




## Limitations of Traditional Audit Logging

- Dependence explosion problem (NDSS'13)
  - Long running programs generate a lot of system level dependences during their lifetime
- High overhead
  - Linux Audit Framework: ~40%
     run time slow down
  - Space overhead
  - Our solution
    - ProTracer (NDSS'16 Distinguished Paper)







## Example: Avoid *Redundant* Events

```
1.# vim opening a large file
                  2.
                  3.
                        while((size = read(fd, buf)) > 0):
                                 add node (root, buf)
                  4.
                  5.
                           exit();
                                                                                          ProTracer
Logging
                                                  T[ PID=1483 ] = { vim }
                                                  T[ PID=1483 ] = T[ PID=1483 ] V { fd } = { vim, fd }
PID = 1483, TYPE = $Y$CALL: Syscall = read
                                                  T[ PID=1483 ] = T[ PID=1483 ] V { fd } = { vim, fd }
PID = 1483, TYPE = SYSCALL: Syscall = read
                                                  T[ PID=1483 ] = T[ PID=1483 ] V { fd } = { vim, fd }
PID = 1483, TYPE = SYSCALL: Syscall = read
                                                  T[PID=1483] = T[PID=1483] V \{fd\} = \{vim, fd\}
PID = 1483, TYPE = SYSCALL: Syscall = read
```

PID = 1483, TYPE = SYSCALL: Syscall = read

PID = 1483, TYPE = SYSCALL: Syscall = read

PID = 1483, TYPE = SYSCALL: Syscall = exit

T[ PID=1483 ] = T[ PID=1483 ] V { fd } = { vim, fd }

T[ PID=1483 ] = T[ PID=1483 ] V { fd } = { vim, fd }

LogBuffer: T[ PID=1483 ] = { vim, fd }



## Example: Lazy Flushing

```
1. # temporary files
2. f = open(fname, create | write)
3. # File manipulation on the file
4. while (not done)
5. edit(f)
6. # delete temporary file
7. delete(f)
```

```
Logging

...

TYPE = SYSCALL: Syscall = open ED = 8

TYPE = SYSCALL: Syscall = write, FD = 8

....

TYPE = SYSCALL: Syscall = write, FD = 8

TYPE = SYSCALL: Syscall = unlink, FD = 8

...
```

#### ProTracer

```
...

T[ FD=8 ] = { }

T[ FD=8 ] = { vim }

LogBuffer: T[ FD=8 ] = { vim }

T[ FD=8 ] = T[ FD=8 ] V { vim } = { vim }

LogBuffer: T[ FD=8 ] = { vim }

DEL: T[ FD=8 ]

...
```

#### LogBuffer

```
T[ FD=8 ] = { vim }
T[ FD=8 ] = { vim }
```





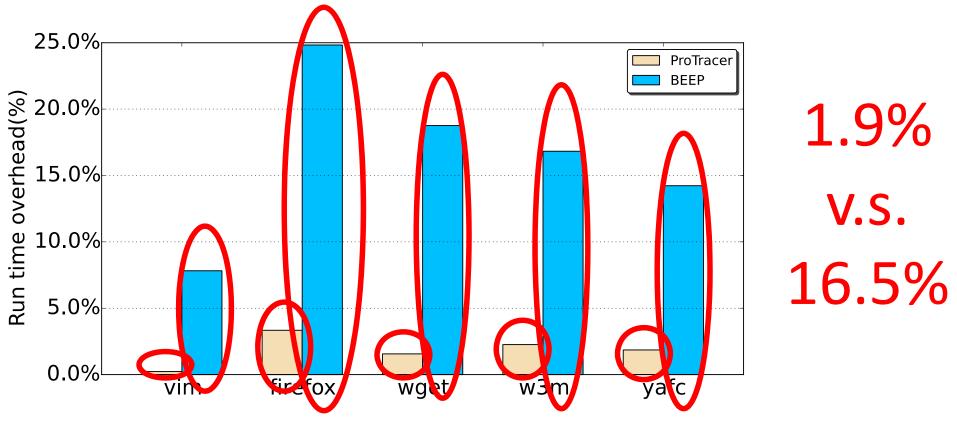
# Evaluation: Storage Efficiency (3 months, client)



[NDSS'13] 168,269,688 KB ProTracer **2,437,010** KB



## Evaluation: Run time Efficiency (Client Programs)



Whole system: 7% v.s. 40%



bn state

### Outline

#### **Temporal Dynamic Analysis:**

analyze program execution history

- 1. Attack investigation
- 2. Application vetting

- 1. Execution partitioning overcomes the dependence explosion problem
- 2. ProTracer reduces space consumption by from over 1GB per day to less than 20MB per day, and runtime overhead from 40% to 7%

**Dynamic Analyses** 



### Outline

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#### **Spatial Dynamic Analysis:**

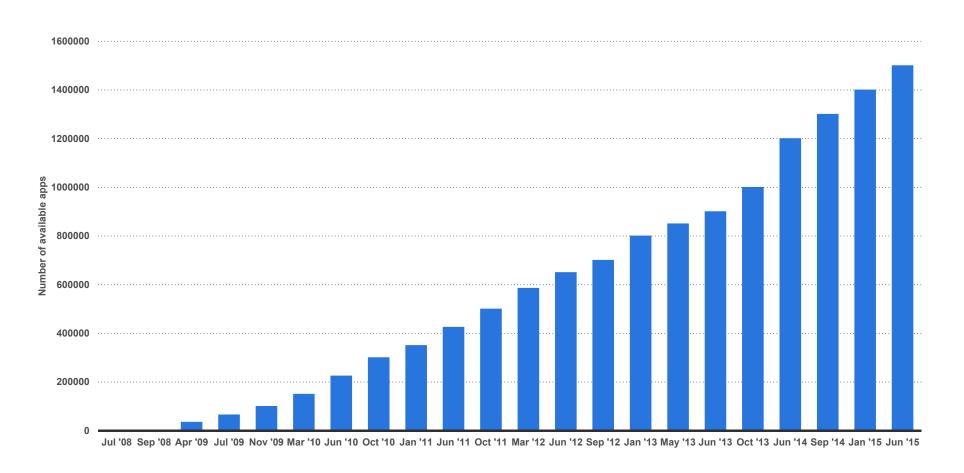
analyze a snapshot of program execution state

3. Memory forensics

**Dynamic Analyses** 



# Motivation: Total number of iOS applications (2008-2015)





## Motivation: ...but Apple is watching out for you

Apple has a pre-release app vetting procedure call App Review

"We review all apps [...] to ensure they are reliable, perform as expected, and are free of offensive material."

- Apple App Review Team

https://developer.apple.com/app-store/review/

Apple is secretive about the specific evaluation ... Security?



## Motivation: Total number of iOS applications (2008-2015)





#### Observations...

App Review vetting procedure is:

- 1) Very fast and lightweight
- 2) "Almost" fully automated
- 3) Static Program Analysis



#### Observations...

App Review vetting procedure is:

**Easily Subverted!** 

1) Very fast and lightweight

2) "Almost" fully automated

3) Static Program Analysis

Control Flow & Data Obfuscation

Wang et.al [USENIX Security'13]

Han et.al [ACNS'13]

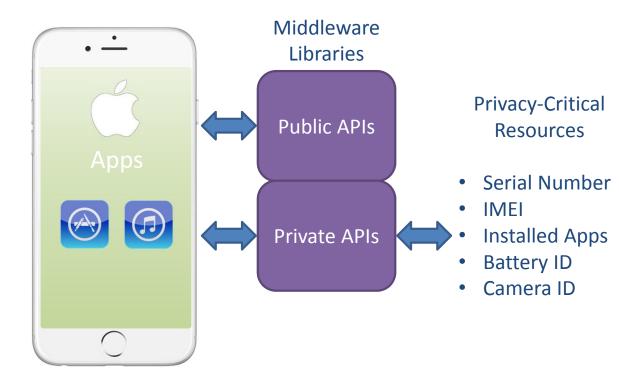
Zheng et.al [ASIACCS'15]

InstaStock, FindAndCall,
PawnStorm.A, LBTM, FakeTor,
XCodeGhost, etc....



### Goal: Private APIs

Middleware APIs reserved only for Apple's internal use

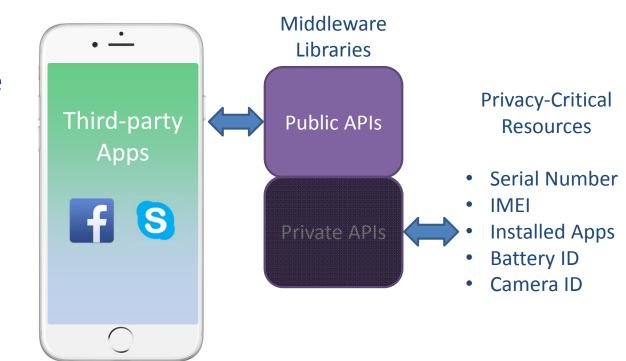




#### Goal: Private APIs

Middleware APIs reserved only for Apple's internal use

Private APIs are not exported for third-party code to use



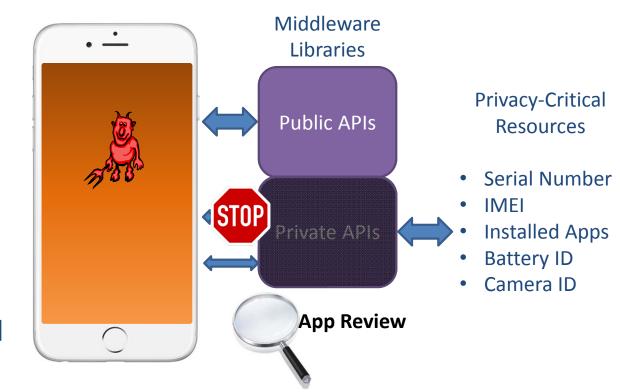


#### Goal: Private APIs

Middleware APIs reserved only for Apple's internal use

Private APIs are not exported for third-party code to use

Malware are still finding and invoking the Private API despite vetting





#### Private API Abuse is Difficult To Detect

iOS applications are mostly written in Objective-C & Objective-C functions can be called sending a message to object

Invoke method **foo** on object **obj** with parameter **param**:

objc\_msgSend ( obj, "foo", param );



### Private API Abuse is Difficult To Detect

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Invoke method **foo** on object **obj** with parameter **param**:

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Message Selector = String



#### Private API Abuse is Difficult To Detect

iOS applications
Objective-C func

Static Analysis will not be able to detect complex private API invocations!

C & essage to object

Invoke method **foo** on object **obj** with parameter **param**:

```
char sel[3]; strcpy (sel, "f"); strcat (sel, "oo"); objc_msgSend (objc, sel, param); + Obfuscation + Encryption
```



## iRiS - Automated Vetting of Private API Abuse

#### **Forced Execution**



Drives the app's execution to unresolved API call sites using forced execution



#### **Forced Execution**

- Dynamic analysis engine that forces a binary to execute
  - Provide no inputs or any environment setup
    - Use random inputs
  - Force branch outcomes at a few places



```
char hidden[] = \sqrt{x73} \times 68 \times 75 \times 74 \times 64 \times 65 \times 77"
1.
2.
                        \x0.05 \x60\x65\x76\x69\x67\xb7";
3.
     getAppsOrShutdown( void * obj, int key )
       char * sel;
       if( time() == DEC_21_2017)
7.
         sel = XOR(hidden, key);
9.
10.
       else
11.
           sel = "allInstalledApplications";
12.
13.
14.
       objc_msgSend( obj, sel );
15. }
```

iRiS must resolve the value of **sel** at this call

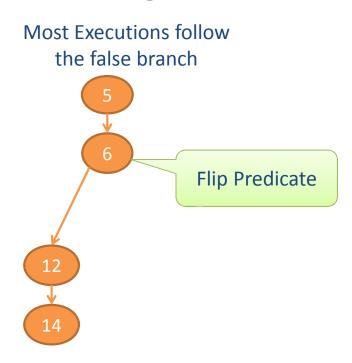


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char hidden[] = \sqrt{x73} \times 68 \times 75 \times 74 \times 64 \times 65 \times 77"
1.
2.
                        \x0.05 \x60\x65\x76\x69\x67\xb7";
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    getAppsOrShutdown( void * obj, int key )
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       if( time() == DEC_21_2017)
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         sel = XOR(hidden, key);
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           sel = "allInstalledApplications";
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       objc_msgSend( obj, sel );
15. }
```

Not Resolvable by Static Analysis



```
char hidden[] = \sqrt{x73} \times 68 \times 75 \times 74 \times 64 \times 65 \times 77"
1.
                        x6e\x44\x65\x76\x69\x67\xb7";
2.
3.
    getAppsOrShutdown( void * obj, int key )
       char * sel;
       if( time() == DEC_21_2017)
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9.
       else
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           sel = "allInstalledApplications";
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14.
       objc msgSend( obj, sel );
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```



iRiS determines if a new call target can be resolved by flipping a predicate

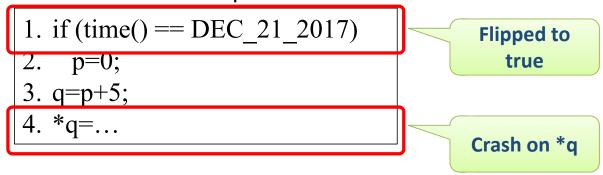


```
Force Execution
                               char hidden[] = \sqrt{x73} \times 68 \times 75 \times 74 \times 64 \times 65 \times 77"
  1.
                                                                                                                                                                                                                                                                                                                                                                                                                                            Resolved Code Path
  2.
                                                                                                                                                 \x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.05\x0.
   3.
                             getAppsOrShutdown( void * obj, int key )
                                           char * sel;
                                           if( time() == DEC_21_2017)
  7.
                                                          sel = XOR(hidden, key);
  9.
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               key = 1234
  10.
                                           else
 11.
                                                                  sel = "allInstalledApplications";
 12.
 13.
 14.
                                            objc_msgSend( obj, sel );
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         14
                                                                                                                                                                                                                                                                                                                                     sel = "shutdownPhone"
15. }
```



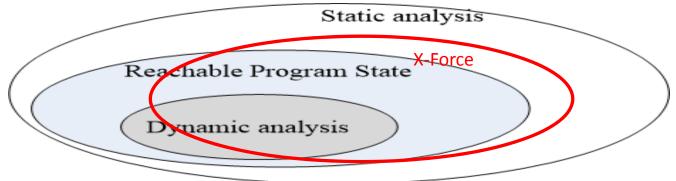
### Crash-free Execution Model

- Ideas on memory access exception
  - Skip it?
    - A lot of following exceptions, cascading effect on program state corruption
    - Lose heap data
  - Allocate a piece of memory on demand
    - It is not sufficient by just fixing the corrupted pointer itself
    - Fix the other correlated pointers





### The Essence of X-Force



- X-Force is neither sound nor complete
  - Unsound due to path infeasibility and violation of input precondition
  - Incomplete due to the prohibitively large search space
- A pragmatic solution for certain applications
  - Fast
  - Path feasibility may be violated at only a small number of places
    - Less than 10 dynamic predicates out of hundreds of thousands.
  - Naturally handle packed, obfuscated, and even self-modifying binaries
  - Existing dynamic analysis can be easily ported to X-Force
  - Good at exposing behavior, cannot generate exploit inputs



### iRiS Evaluation

Vetting platform: iPad 4 + Our ported Valgrind (iOS)

2019 free apps from official App Store

9 categories

Popular apps listed in iTunes Preview

Crawled in March 2015

App size: 1-80MB, median 3MB



### iRiS Evaluation

149 (7%) applications use private APIs

Identified a total number of 153 private APIs

Apple brought down most of these apps from their store after our paper was published

http://www.digitaljournal.com/technology/apple-blacklists-hundreds-of-apps-that-stole-personal-user-data/article/446995



### Private APIs: Access User Identification

Framework	API Name	Functionality	#Apps
SpringBoardServices	SBSSpringBoardServerPort	Initialize port with Springboard	3
	SBSCopyApplicationDisplayIdentifiers	Obtain ids of all running apps	3
	SBFrontmostApplicationDisplayIdentifier	Obtain id of the front most app	3
	SBSCopyLocalizedApplicationNameForDisplayIdentifier	Get app name from its id	33
MobileCoreServices	[LSApplicationWorkspace defaultWorkspace]	Obtain the default workspace object	2
	[LSApplicationWorkspace allApplications]	Get all installed apps	1
	[LSApplicationWorkspace allInstalledApplications]	Get all installed apps	1
	[LSApplicationWorkspace applicationIsInstalled:]	Check if a specific app is installed	1



## Private APIs: More User Identification

Framework	API Name	Functionality	#Apps
AppleAccount	[AADeviceInfo appleIDClientIdentifier]	Obtain the Apple ID of the device user	1
AdSupport	[ASIdentifierManager sharedManager]	Obtain a reference to the ASID manager	25
	[ASIdentifierManager advertisingIdentifier]	Obtain the device's ASID	25
	[ASIdentifierManager advertisingTrackingEnabled]	Check if advertising tracking is enabled	23
lOKit	IOMasterPort	Initialize communication with IOKit	21
	IOServiceMatching	Find and open the specified IOService object	21
	IOServiceGetMatchingService		21
	IORegistryEntryCreateCFProperty	Locate the specified property (e.g. S/N)	19



## Range of Obfuscation Tactics

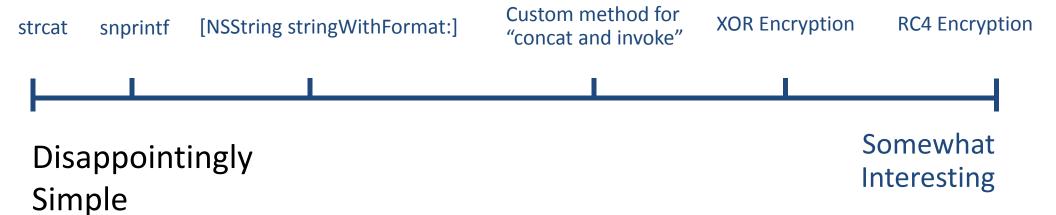
strcat snprintf [NSString stringWithFormat:] Custom method for "concat and invoke"

Disappointingly Simple

Somewhat Interesting



## Range of Obfuscation Tactics





### Outline

#### **Temporal Dynamic Analysis:**

analyze program execution history

- 1. Attack Investigation
- 2. Application vetting

#### **Spatial Dynamic Analysis:**

analyze a snapshot of program execution state

3. Memory forensics

**Dynamic Analyses** 



### Outline

#### **Temporal Dynamic Analysis:**

analyze program execution history

- 1. Audit logging
- 2. Forced execution

#### **Spatial Dynamic Analysis:**

analyze a snapshot of program execution state

3. Memory forensics

**Dynamic Analyses** 



# Execution State (in Memory) Contains Rich Information

**Running Processes** 

Volatile IPC Data

**Executing Malware** 

**Decrypted Private Data** 



**Open Network Connections** 

**Encryption Keys** 

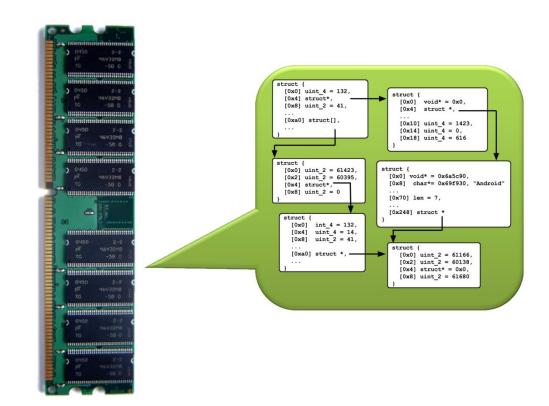
Application Data (Browser History, Chat Logs, ...)

Much More ...



# In-Memory Information Reverse Engieering

Information in memory is stored in Data Structures



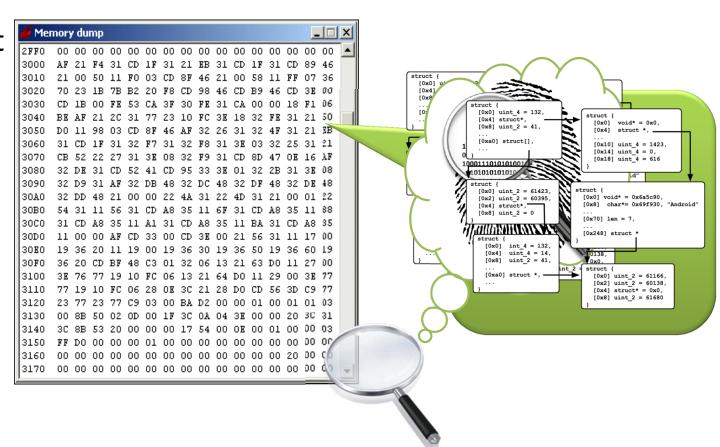


# In-Memory Information Reverse Engineering

Investigators collect a memory image

Build signatures of data structures to recover

Scan the memory image to find data structure instances





# (Prior) State of the Art: Data Structure Recovery

Evidence is recovered from plain-text or self-contained fields

```
struct user_account {
                                                                   [0x0] uint 4 = 132,
[00x0]
               short int u type;
                                                                                     struct {
                                                                                      [0x0] void* = 0x0,
                                                                   [0x8] uint_2 = 41,
                                                                                      [0x4] struct *, .
[0x04]
               pid_t u_pid;
                                                                                      [0x10] uint 4 = 1423,
                                                                                      [0x14] uint_4 = 0,
                                                                                      [0x18] uint 4 = 616
[80x0]
               char u line[32];
[0x28]
               char uid[4];
                                                                   [0x0] uint_2 = 61423,
                                                                                    [0x0] void* = 0x6a5c90.
                                                                   [0x2] uint 2 = 60395,
                                                                                    [0x8] char*= 0x69f930, "Android"
                                                                  [0x4] struct*,
[0x8] uin+ 2 = 0
[0x2C]
               char user[32];
                                                                                    [0x701 len = 7]
                                                                                    [0x248] struct *
[0x4C]
               char password[128];
[0xCC]
               char u host[128];
                                                                                      [0x0] uint_2 = 61166,
[0x2] uint_2 = 60138,
[0x14C] short e termination;
                                                                                      [0x4] struct* = 0x0,
                                                                                      [0x8] uint_2 = 61680
```



# A Cyber-Crime

Based on true events that occurred at the authors' university...



# State of the Art ... but Limited

Finds raw data structure instances in memory image

Still cannot understand the **content** of the data structure!

E.g., images, documents, formatted/encoded data

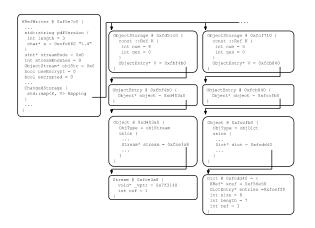
```
XRefWriter @ 0xf5e7c0 {
std::string pdfVersion {
                                  ObjectStorage @ 0xfd51c0 {
                                                                    ObjectStorage @ 0xfcf710 {
 int length = 3
                                   const :: Ref K {
                                                                      const :: Ref K {
 char* s = 0xcfc660 "1.4"
                                    int num = 8
                                                                       int num = 5
                                    int qen = 0
                                                                       int qen = 0
uint* streamEnds = 0x0
int streamEndsLen = 0
                                   ObjectEntry* V = 0xfbf4b0
                                                                      ObjectEntry* V = 0xfcb840
ObjectStream* objStr = 0x0
bool useEncrypt = 0
bool encrypted = 0
ChangedStorage {
                                 ObjectEntry @ 0xfbf4b0 {
                                                                    ObjectEntry @ 0xfcb840 {
 std::map<K, V> Mapping
                                   Object* object = 0xd403a0
                                                                      Object* object = 0xfccfb0
                                  Object @ 0xd403a0 {
                                                                     Object @ 0xfccfb0 {
                                   ObjType = objStream
                                                                      ObjType = objDict
                                   union {
                                                                      union {
                                     Stream* stream = 0xfce3a8
                                                                       Dict* dict = 0xfcdd40
                                                                     Dict @ 0xfcdd40 = {
                                  Stream @ 0xfce3a8 {
                                                                      XRef* xref = 0xf56e50
                                   void* vptr = 0x7f3140
                                                                     DictEntry* entries =0xfceff0
                                   int ref = 1
                                                                     int size = 8
                                                                     int length = 7
                                                                      int ref = 1
```



# **DSCRETE: Content Reverse Engineering**

[Usenix Security Best Student Paper]

The application that defined the data structure contains printing/rendering logic for it too!





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	Name John Taylor	Homework A	Exam C	Final		
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ı	John Taylor Jason Zhang Julian Smith	A A A	C B C	A A B		
ı	John Taylor Jason Zhang Julian Smith Christopher Zhu	A A A	C B C	A A B D		



# SPAGETIER GRONTENT Reverse Engineering

[Usenix Security Best Student Paper]

Input: Data Structure Instance

**Output: Formatted Content** 

Printing/Rendering Logic

#### **Program Code**

```
struct pdf* my_pdf;
my_pdf = load_pdf_file(...);
main_loop(my_pdf); // User edits PDF
save_pdf_file(my_pdf);
exit(0);
```

#### **Rendering Function**

```
save_pdf_file(struct pdf* ptr)
{
   char* buf = format_pdf(ptr);
   fwrite(buf, ...);
}
```



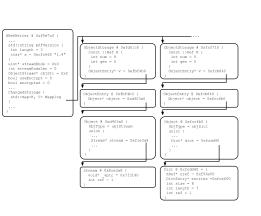
### Scanner+Renderer

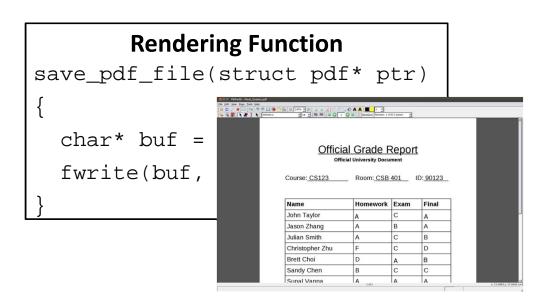
```
Rendering Function
save_pdf_file(struct pdf* ptr)
{
  char* buf = format df(ptr);
  fwrite(buf, ...);
}
```

Intuition: Invalid input will crash the rendering logic



## Scanner+Renderer





Present every offset of a memory image to the rendering logic & Reported the valid output

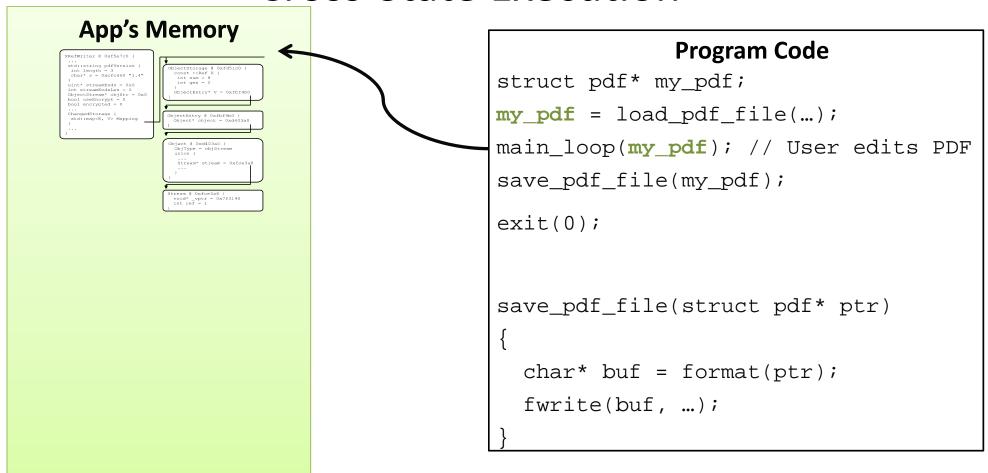


#### **Identified Candidate**

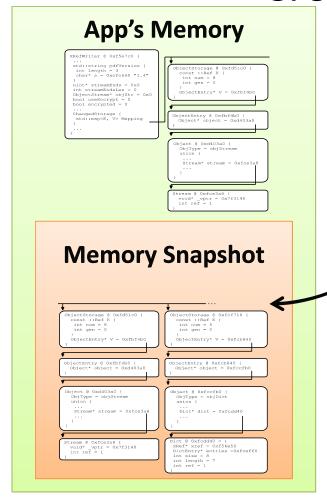
```
Program Code
struct pdf* my_pdf;
my_pdf = load_pdf_file(...);
main_loop(my_pdf); // User edits PDF
save_pdf_file(my_pdf);
exit(0);

save_pdf_file(struct pdf* ptr)
{
   char* buf = format(ptr);
   fwrite(buf, ...);
}
```









```
Program Code
struct pdf* my_pdf;
my_pdf = load_pdf_file(...);
main_loop(my_pdf); // User edits PDF
```

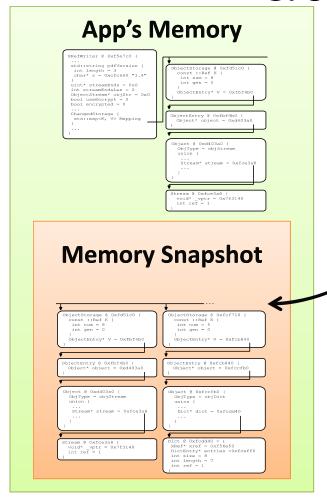
evit

#### **Begin Cross-State Execution!**

- 1. Map in memory snapshot
- 2. Swap my\_pdf pointer

save\_pdf\_file(my\_pdf);





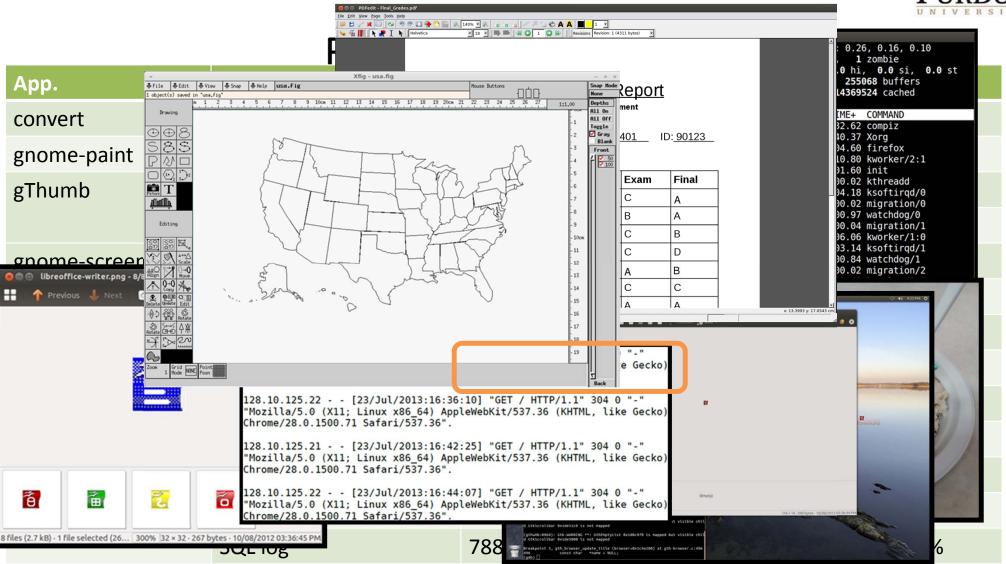
```
Program Code
struct pdf* my_pdf;
my_pdf = load_pdf_file(...);
main_loop(my_pdf); // User edits PDF
save_pdf_file(my_pdf);
exit(0);
save_pdf_file(struct pdf* ptr)
  char* buf = format(ptr);
  fwrite(buf, ...);
```



# Let's catch that criminal...









# VCR: Reverse Engineer Preview Pictures





Photographic Evidence is available as soon as a camera app is opened, even without taking a photo or video

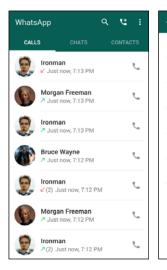


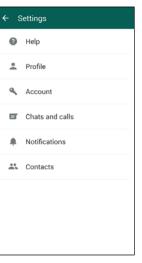


Camera preview is always buffering frames

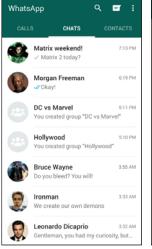


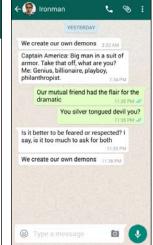
# GUI: Reverse Engineer User Interfaces

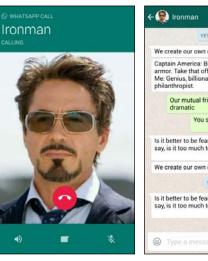














Screen -6 Screen -5

Screen -4

Screen -3

Screen -2

Screen -1

Screen 0



### Outline

#### **Temporal Dynamic Analysis:**

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**Dynamic Analyses** 



### Outline

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**Dynamic Analyses** 



Thank you! Questions?