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# Malware Analysis

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# Introduction

- Malware
  - software intentionally designed to cause damage
- Malware Detection techniques
  - Static analysis
  - Dynamic analysis



# Introduction

- Static analysis
  - testing and evaluation of an application by examining the code without executing the application
  - Pros:
    - Good code coverage
    - Time efficiency
  - Cons:
    - False positives
    - Code obfuscation
    - Encryption



# Introduction

- Dynamic analysis
  - testing and evaluation of an application during runtime
  - Pros:
    - Capture behaviors accurately
  - Cons:
    - Poor code coverage
    - High runtime overhead



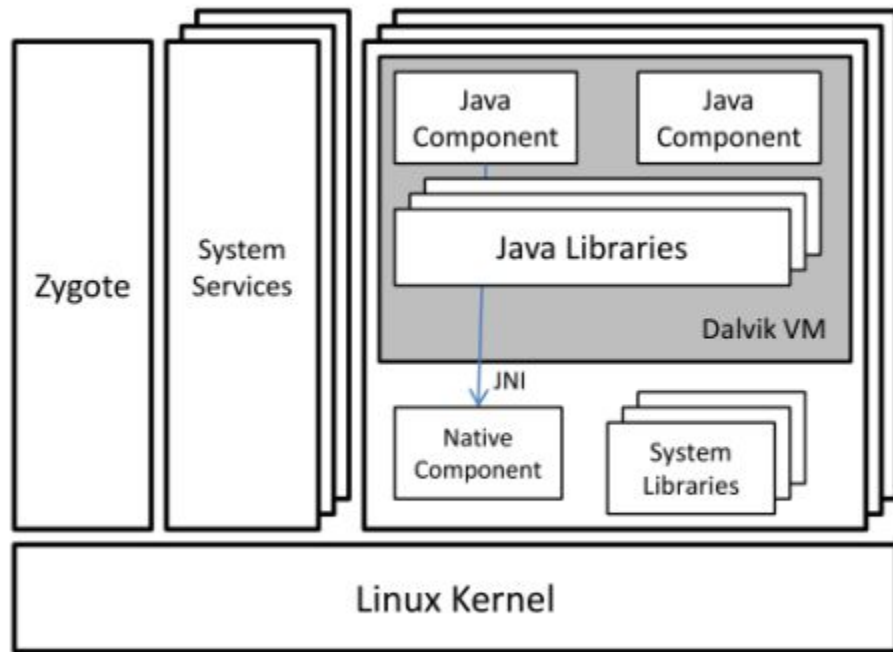
# DroidScope: Seamlessly Reconstructing the OS and Dalvik Semantic Views for Dynamic Android Malware Analysis

Lok Yan, Heng Yin

Syracuse University

Usenix Security 2012

# Android



Java Components

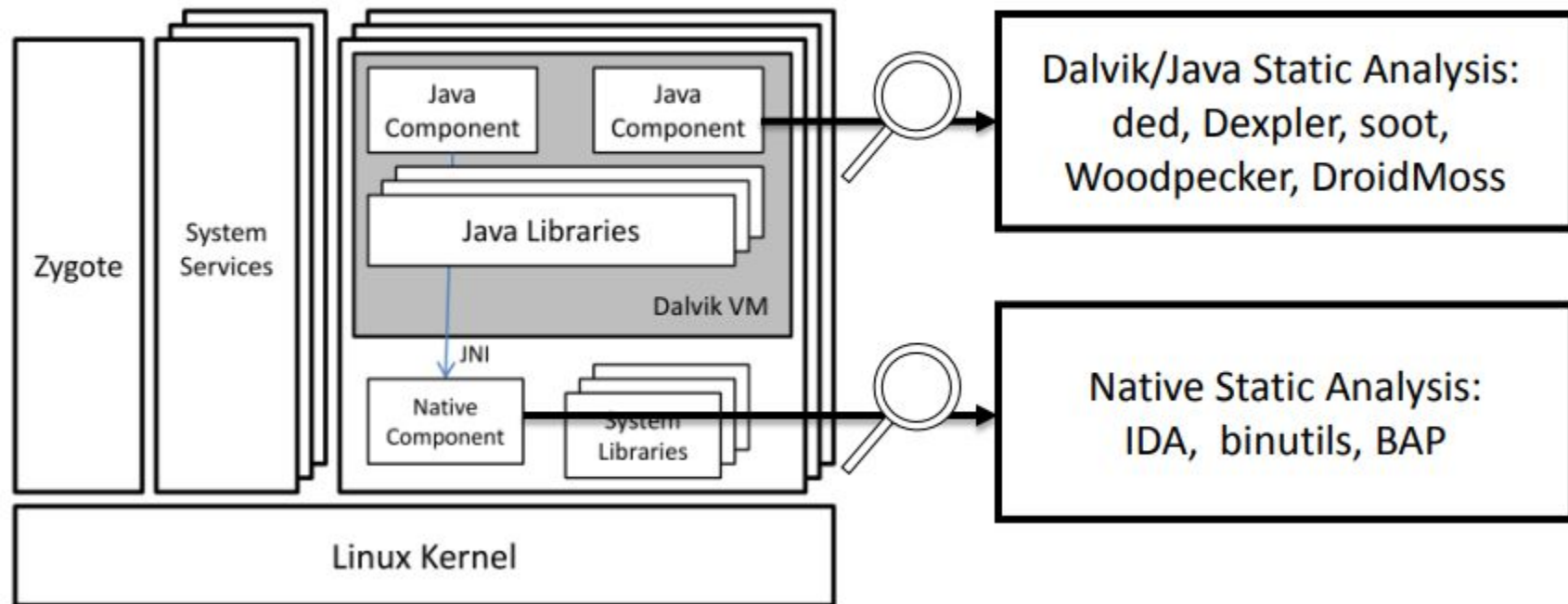


Native Components

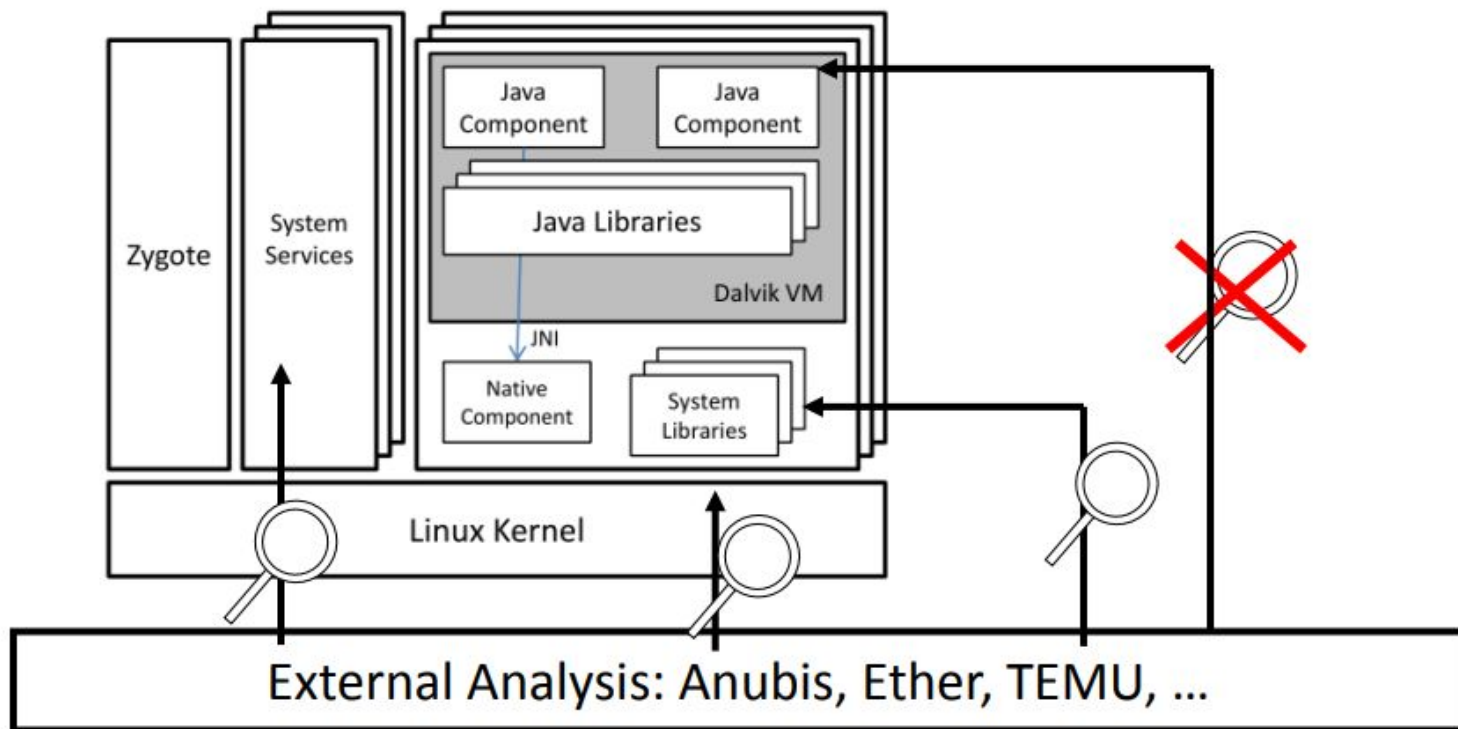
System Services

Apps

# Motivation

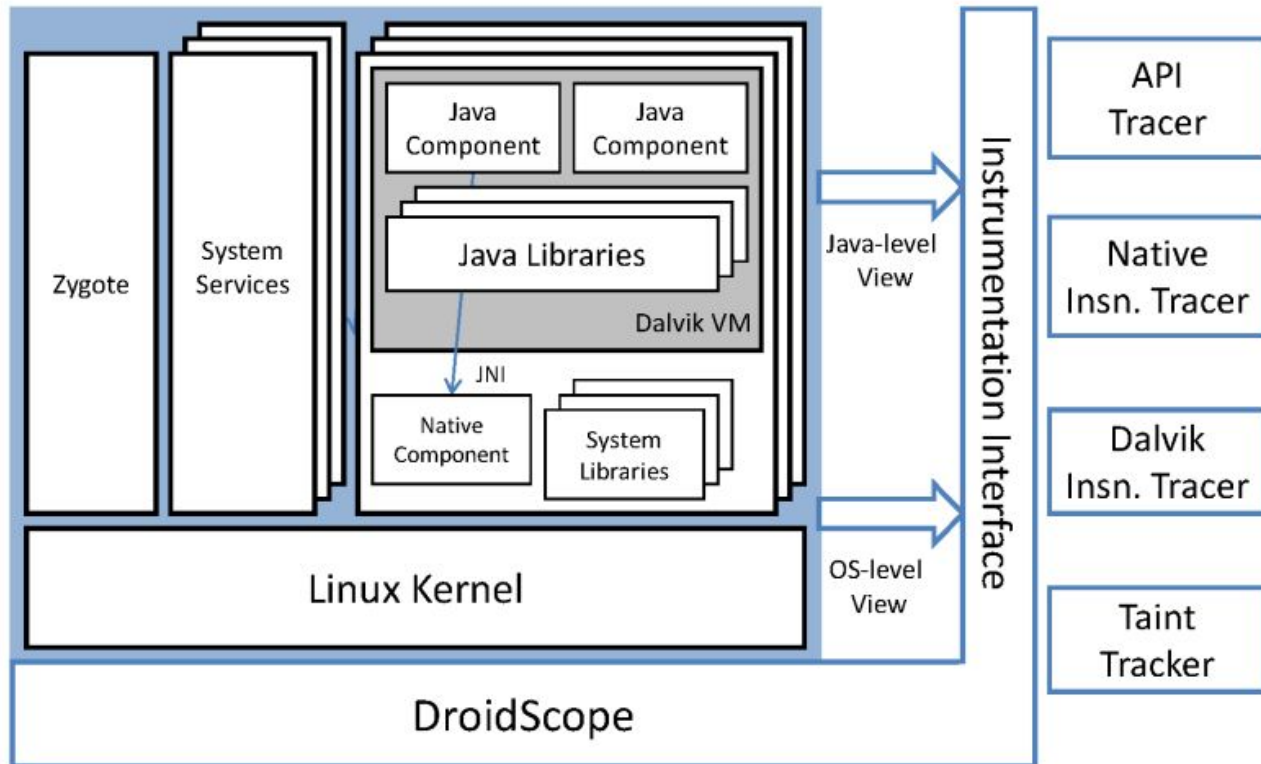


# Motivation





# DroidScope Overview



# DroidScope Overview

- Dynamic binary instrumentation for Android
  - Leverage Android Emulator in SDK
  - No changes to Android Virtual Devices
  - External instrumentation
    - Linux context
    - Dalvik context
  - Extensible: plugin-support / event-based interface
  - Performance
    - Partial JIT support
    - Instrumentation optimization

# Linux Context: Identify Apps

- Shadow task list
  - pid, tid, uid, gid, euid, egid, parent pid, pgd, comm
  - argv[0] : app name
- Shadow memory map
  - Address Space Layout Randomization (Ice Cream Sandwich)
  - Update on
    - fork, execve, clone, prctl and mmap2

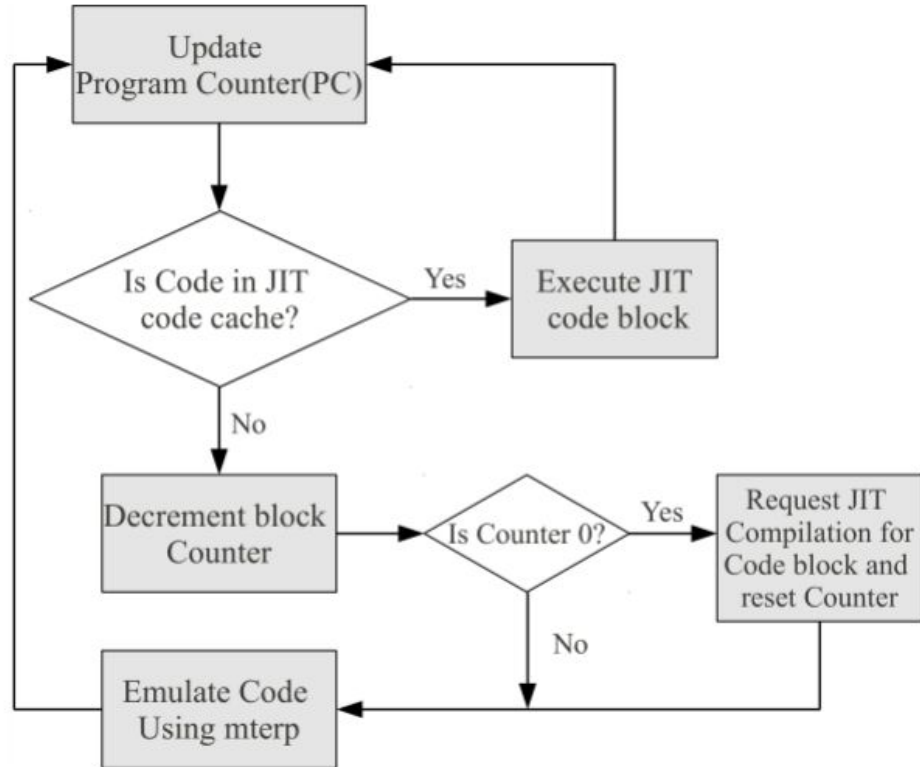
# Java/Dalvik View

- Dalvik virtual machine
  - register machine (all on stack)
  - 256 opcodes
  - saved state, glue, pointed to by ARM R6, on stack in x86
- mterp
  - offset-addressing: fetch opcode then jump to  
 $(\text{dvmAsmInstructionStart} + \text{opcode} * 64)$
- Which Dalvik opcode?
  - Locate `dvmAsmInstructionStart` in shadow memory map
  - Calculate `opcode = (R15 - dvmAsmInstructionStart) / 64`.

# Just In Time (JIT) Compiler

- Designed to boost performance
- Triggered by counter
  - mterp is always the default
- Trace based
  - Multiple basic blocks
  - Multiple exits or chaining cells
  - Complicates external introspection
  - Complicates instrumentation

# Disable JIT



# Dynamic Instrumentation

- Event based interface
  - Execution: e.g. native and Dalvik instructions
  - Status: updated shadow task list
- Query and Set, e.g. interpret and change cpu state
- Performance
  - Example: Native instructions vs. Dalvik instructions
  - Instrumentation Optimization

# Dynamic Instrumentation

	NativeAPI	LinuxAPI	DalvikAPI
Events	instruction begin/end	context switch	Dalvik instruction begin
	register read/write	system call	method begin
	memory read/write	task begin/end	
	block begin/end	task updated	
		memory map updated	
Query & Set	memory read/write	query symbol database	query symbol database
	memory r/w with pgd	get current context	interpret Java object
	register read/write	get task list	get/set DVM state
	taint set/check		taint set/check objects
			disable JIT



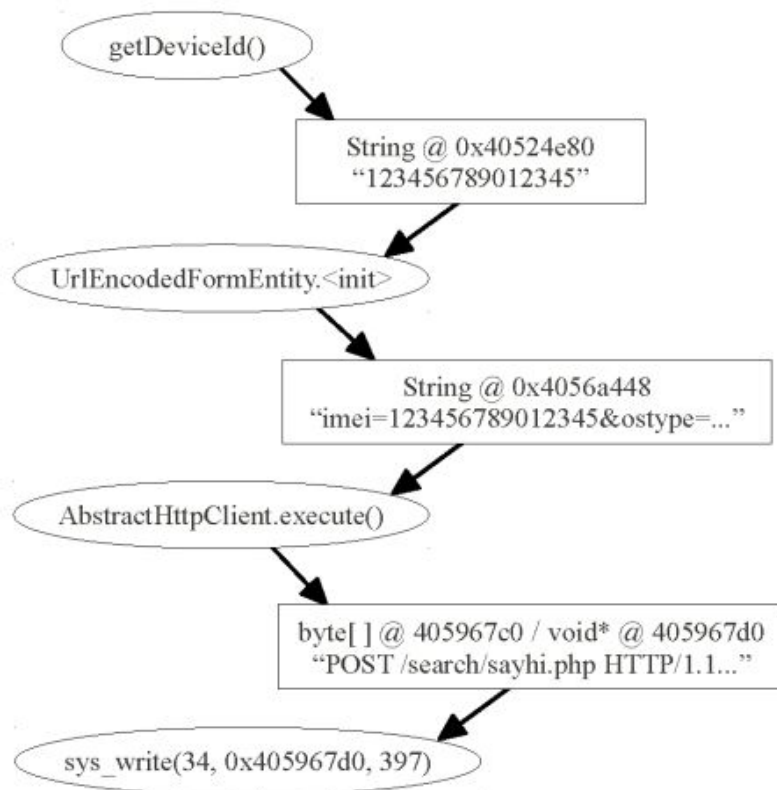
# Example: Dalvik Instruction Tracer

```
1. void opcode_callback(uint32_t opcode) {
2.     printf("[%x] %s\n", GET_RPC, opcodeToStr(opcode));
3. }
4.
5. void module_callback(int pid) {
6.     if (bInitialized || (getIBase(pid) == 0))
7.         return;
8.
9.     getModAddr("dfk@classes.dex", &startAddr, &endAddr);
10.    addDisableJITRange(pid, startAddr, endAddr);
11.    disableJITInit(getGetCodeAddrAddress(pid));
12.    addMterpOpCodesRange(pid, startAddr, endAddr);
13.    dalvikMterpInit(getIBase(pid));
14.    registerDalvikInsnBeginCb(&opcode_callback);
15.    bInitialized = 1;
16. }
17.
18.
19. void _init() {
20.     setTargetByName("com.andhuhu.fengyinchuanshuo");
21.     registerTargetModulesUpdatedCb(&module_callback);
22. }
```

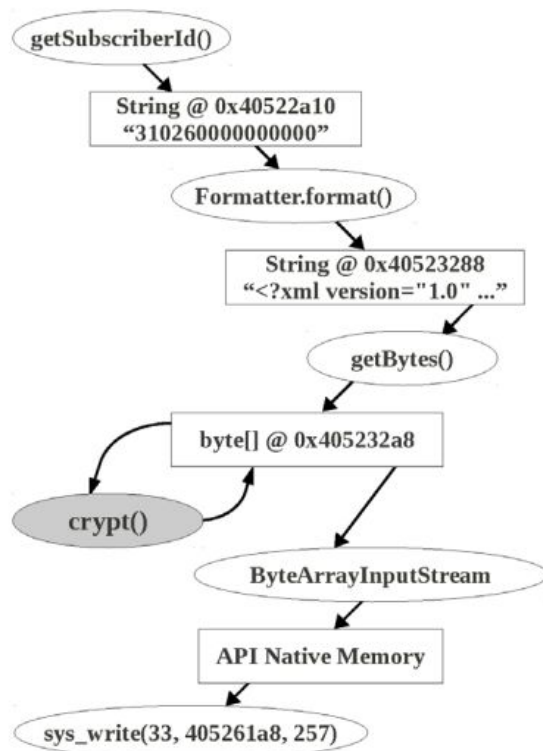
# Usage Evaluation

- Use DroidScope to analyze real world malware
  - API Tracer
  - Dalvik Instruction Tracer
  - Taint Tracker – taint IMEI/IMSI @ move\_result\_object after getIMEI/getIMSI
- Analyze included exploits
  - Removed patches in Gingerbread
  - Intercept system calls
  - Native instruction tracer

# Droid Kung Fu: TaintTracker



# DroidDream: TaintTracker

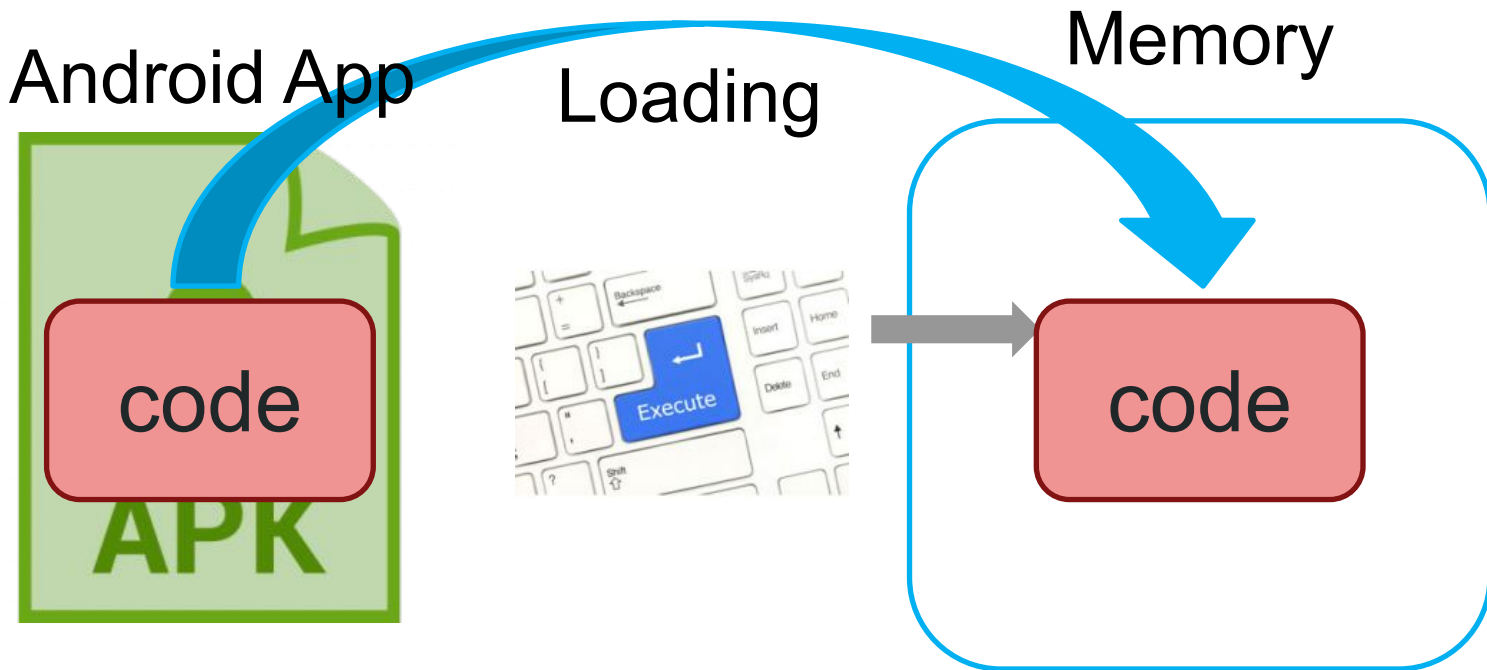


# DeepVMUnpack: Neural Network-based Semantic Recovery from VM-Protected Android Apps for Malware Detection

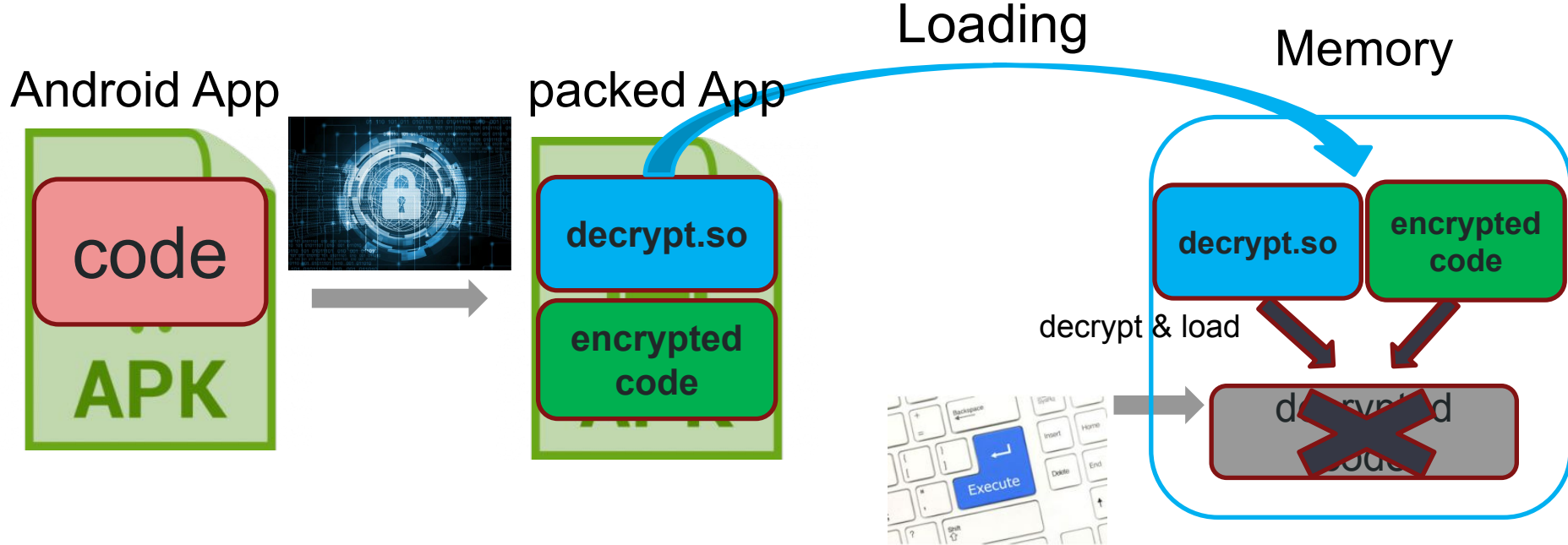
Xin Zhao, Mu Zhang, Yue Duan, Fengyuan Xu

To be submitted

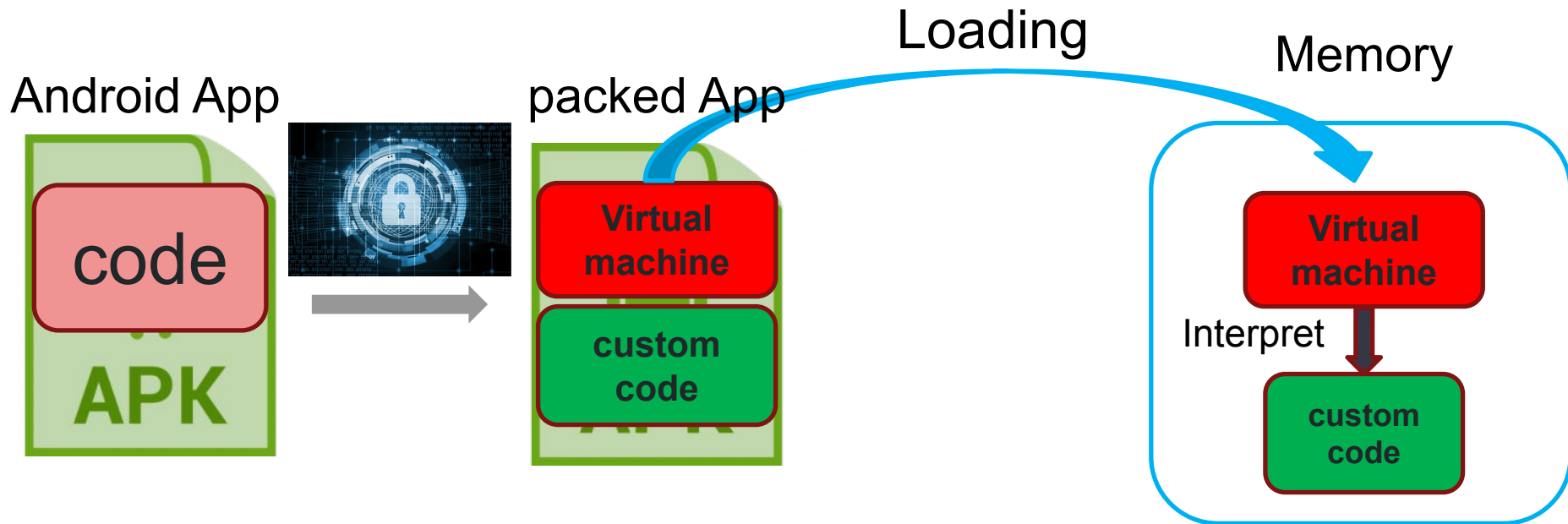
# Android packing



# Android packing

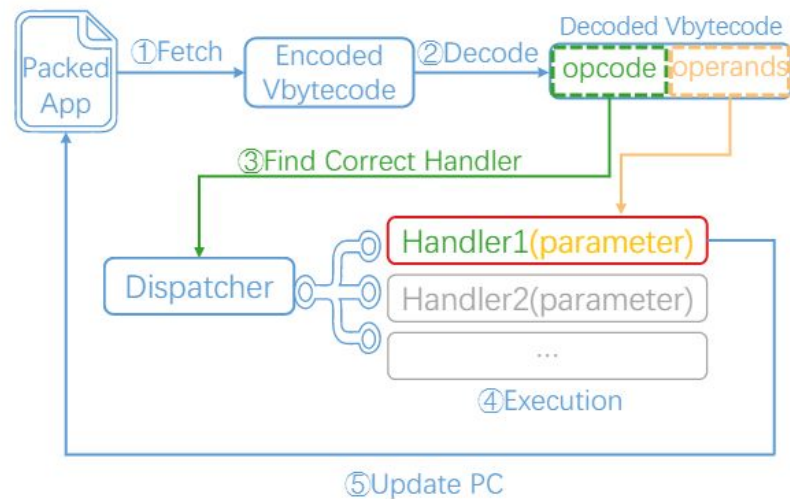
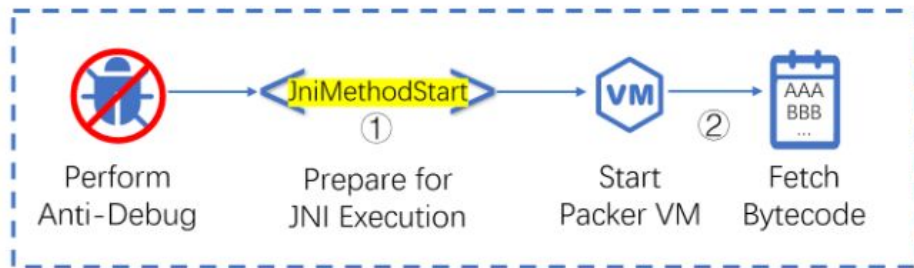


# Android VM-packing

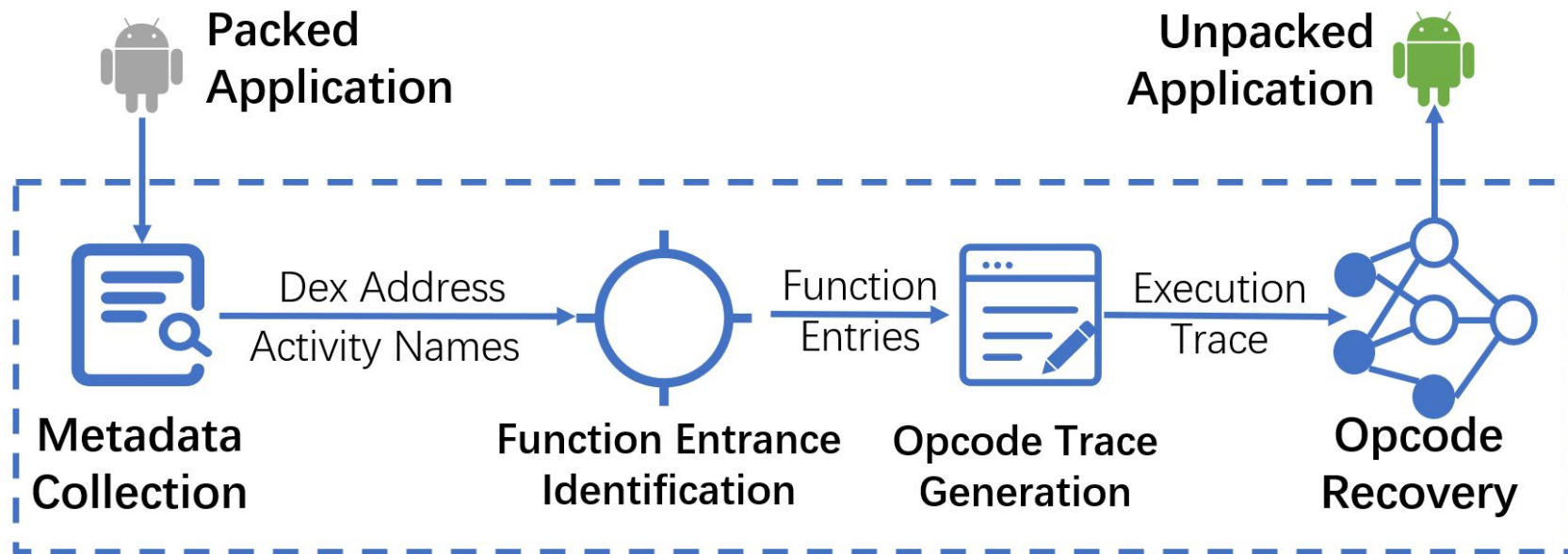




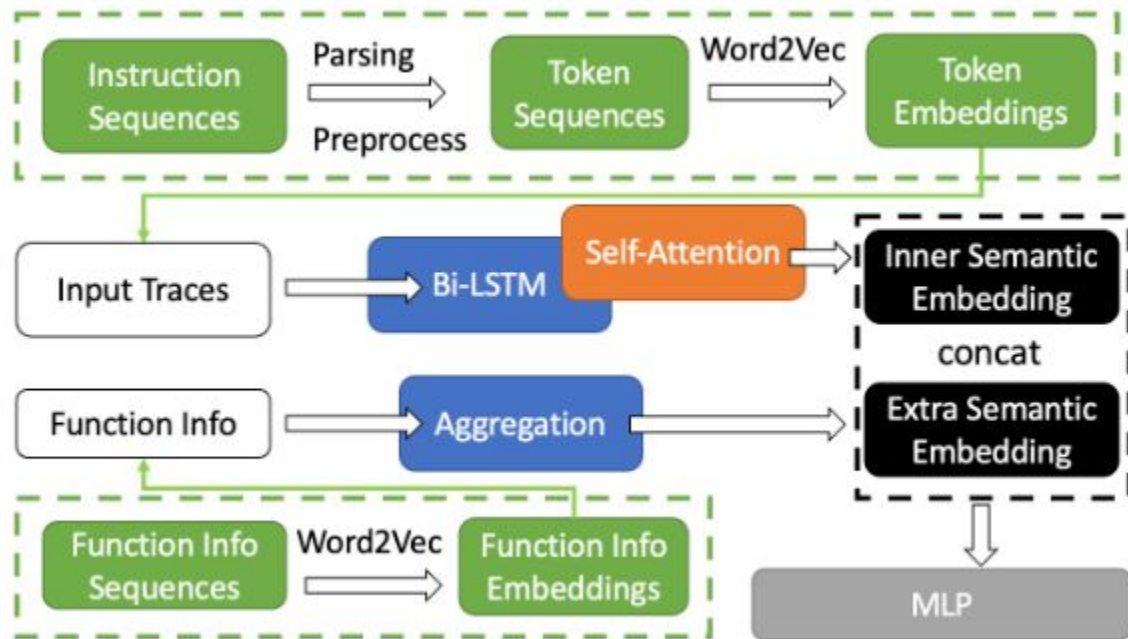
# VM Execution



# DeepVMUnpack Overview



# Deep Learning Model



# Evaluation

Bytecode	Succ	Fail	Accuracy	Bytecode	Succ	Fail	Accuracy	Bytecode	Succ	Fail	Accuracy
0x13	106	0	1.0	0x14	23	17	0.57	0x71	47	36	0.56
0x12	429	160	0.72	0x15	54	0	1.0	0x6f	150	5	0.96
0x6e	615	193	0.76	0x22	78	2	0.97	0x70	48	2	0.96
0xc	358	0	1.0	0x38	39	2	0.95	0x1a	167	0	1.0
0x54	34	2	0.94	0x37	2	0	1.0	0x19	9	0	1.0
0x62	28	0	1.0	0x1f	55	90	0.37	0x8	8	0	1.0
0x16	18	0	1.0	0x72	4	0	1.0	0x2	2	0	1.0
0x5b	60	11	0.84	0x75	9	0	1.0	0x74	1	0	1.0
0x18	4	0	1.0	0xb	2	0	1.0	0x8a	1	1	0.5
0x76	1	0	1.0	0xcd	1	0	1.0	average	2353	538	0.81

	F1-Score	Accuracy	Precision	Recall	False Positive	Succ	Total
<b>Parema</b>	0.0000	0.0000	0.0000	0.0000	1.0000	0	62
<b>DEEPMUNPACK</b>	0.9026	0.8226	1.0000	0.8226	0.1774	51	62

**Thank you!**  
**Question?**