



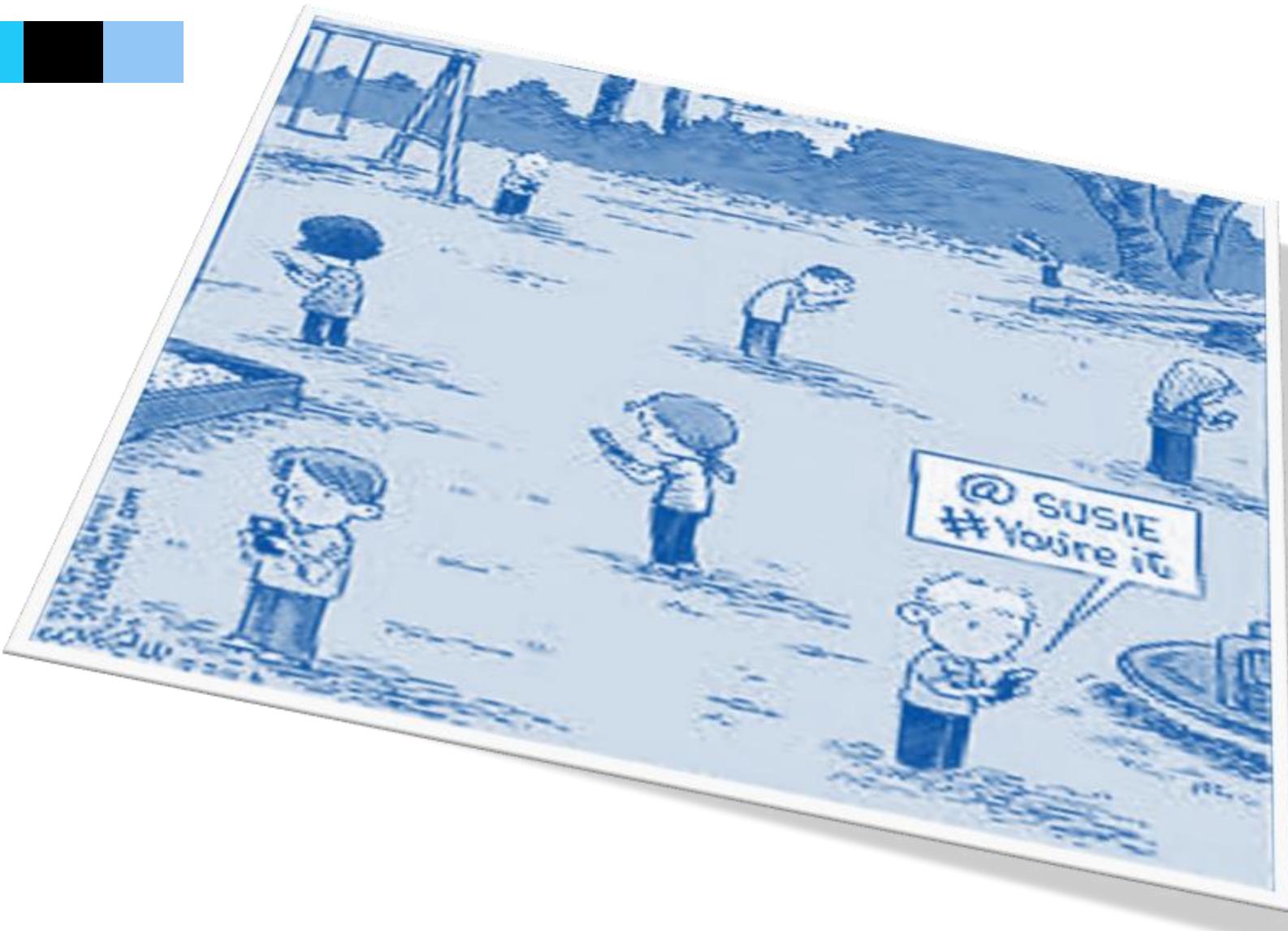
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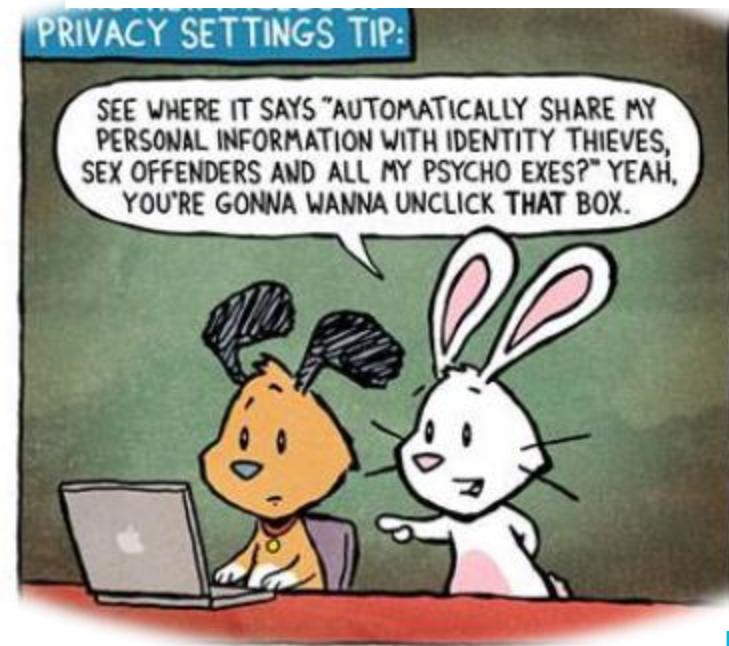
# Privacy Violations Detection in Android like Systems

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*Colloque IMT'2017, November 10<sup>th</sup>*



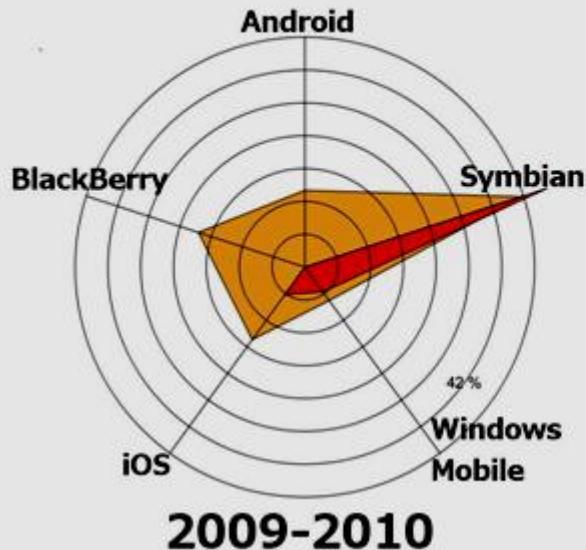




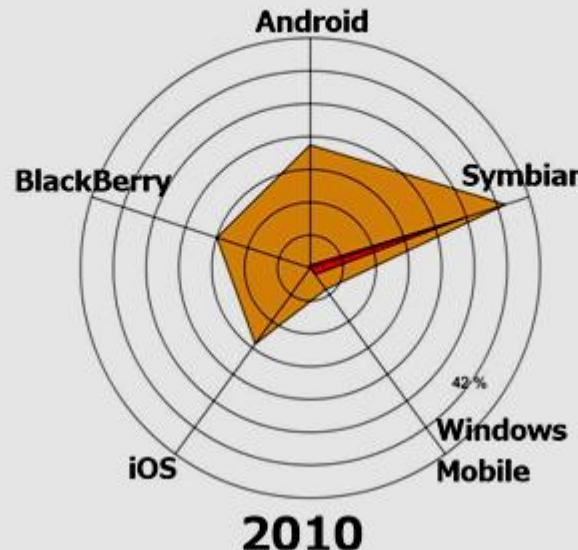
# Why targeting Android?

- Malware
- Market Share

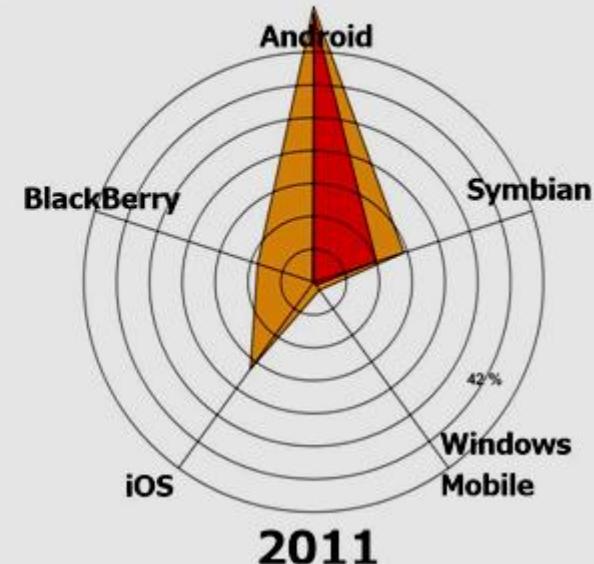
Malware and Market Share Correlation



2009-2010



2010



2011

## 2017

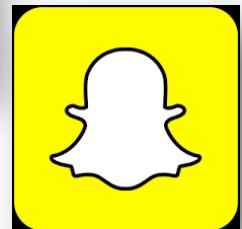
- 71% - 87% market share
- 2.7+ billion apps, 70+ billion downloads (Src: Google)
- 1M+ Android devices activated everyday (Src: Google)

## Ideal platform for security research

\* Juan Tapiador

# Informal problem statement: – How invasive Android Apps are?

- **Uber: knows everywhere you go**
  - Tracking customers
- **Whisper, Yik-Ya: supposedly anonymous**
  - “De-anonymizing users and take control of the account ...”
- **Angry Birds: only a game?**
  - User profiling
- **Snapchat: self-destructing photo app that doesn't**
  - Hacked and lost a database of several million usernames connected to phone numbers.
- **Brightest Flashlight: flashlight apps**
  - Exploiting their phone's internet connection in order to deliver targeted advertising



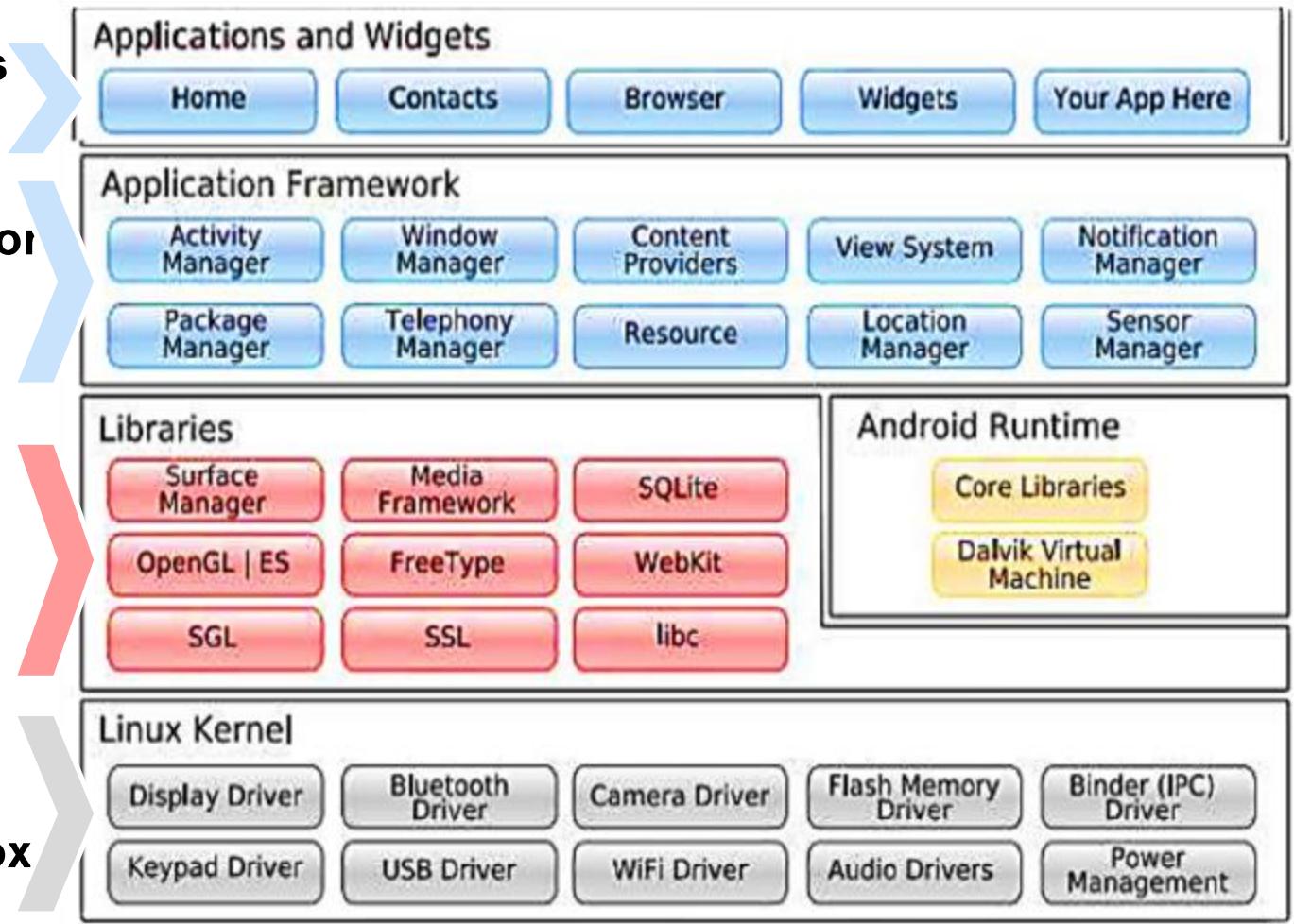
# Informal problem statement:

- Data leakage / Privacy loss

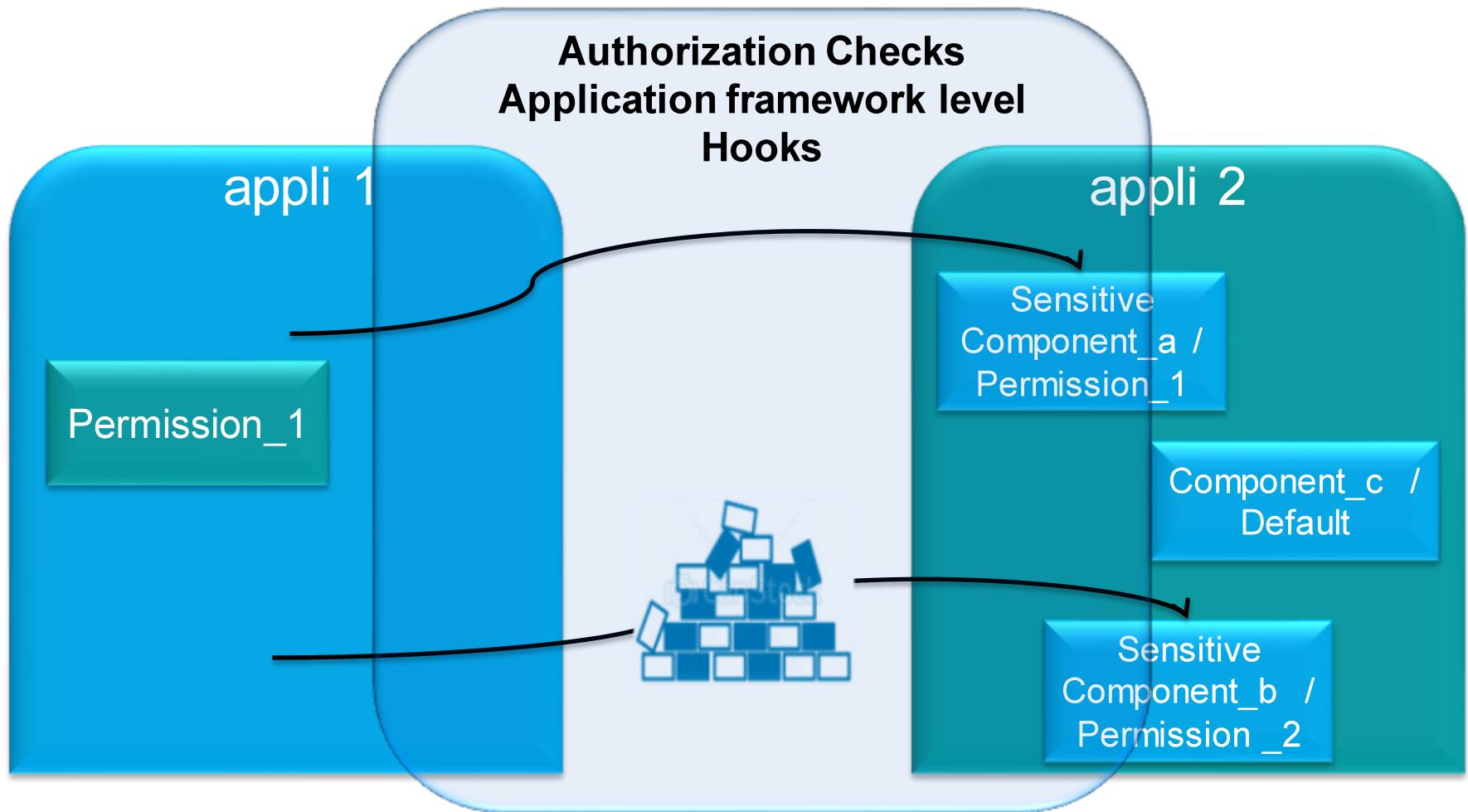
- **Android type system offers a nominal security solutions**
- **Progress has been made in this area**
  - Access control
  - Data flow control
- **Our Research works**
  - Solving under-tainting problem
  - Detecting flows in JNI
  - Dealing with side channel attacks
  - Detecting / Reacting activity hijacking

# Couple of reminders: – Android System Architecture and Security

- **System Applications**
- **User Applications**
- **IPC reference monitor**
- **Sandboxing**
- **Permission levels**
- **Secure boot**
- **Secure file system**
- **Native executables protection**
- **Discretionary AC**
- **Application Sandbox**



# Couples of reminders: – Security in the Application Level



# Some Weaknesses of Android Security Model

- Revocation limits
- Few sources for applications, warnings about security implications displayed during run-time
- Flawed permissions model
- Malware obfuscated inside legitimate-looking applications
- Google play store: insufficient control
- Applications isolation: malicious k-ary applications
- Tricky problem of Patching / Updating



# **Android Security** – Enhanced solutions

## **Access Control** **Data Flow Control**

# Access Control in Android Systems – The progress



## ■ Applications certification

- Kirin (Enck et al.)]
- Avoid manual certification by code inspection (SymbianSigned, Apple)
- Provide lightweight certification based on predefined rules at install-time

## ■ Application access control policy at install

## ■ Application inter-communications security policy at execution

- [Saint (Ongtang et al.)]
- Managing authorization assignments and their use at run-time
- In accordance with the application provider policy

## ■ Dynamic control of permissions granted to applications

- [Apex (Nauman et al.)]
- The user chooses the permissions to be granted to the applications and imposes constraints on the use of resources

## – Access control is not sufficient

- ... of course
- Does not address the data flow problem

# Information flow



- A command sequence implies an information flow from **x** to **y** if the value of **y** after performing this sequence makes it possible to infer information on the value of **x** before the execution of this sequence

- ```
boolean b := <secret>
```

```
if (b) {  
    x := true; f();
```

Information flow from **b** to **x**

# Data flow control: static analysis

## – Reminder

- Analyzing the code without executing it
- Performed at the install-time or compile-time
- Performed on the source or on the bytecode

# Data flow control: static analysis

**Static analysis  
of Dalvik  
bytecode of  
applications**

**Tracking flows  
between URIs to  
generate constraints  
on permissions**

**Requiring the  
source code,  
Packaged  
applications are  
not considered**

**ScanDroid  
[Fuchs et al.]**

**Analyzing  
applications  
before making  
them available**

**Analysis of  
decompiled DEX  
files to discover  
vulnerabilities based  
on intents exchanges**

**Secure  
communication:  
No formal  
guarantees**

**ComDroid  
[Chin et al.]**

**Only Explicit flows are considered**

# Data flow control: dynamic analysis

## – Reminder

- **Instrumentation of the code before its execution**
- **Analysis performed at run-time**
- **Binary code Tracking**

# Data flow control: – “Tainting” based dynamic analysis

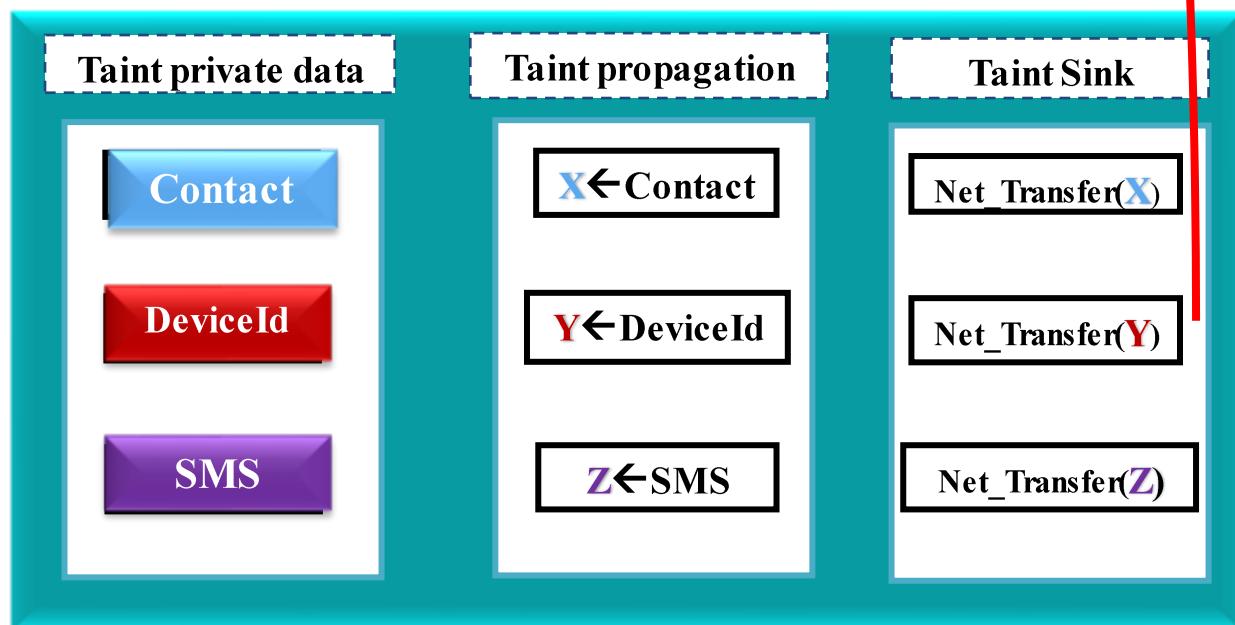
## ■ TaintDroid [Enck et al.]

## ■ Tainting

- Technique for tracing dependencies of information from a given point



```
x = taint ()  
...  
y = z + x  
...  
Sent_Net(y)
```



# “Tainting” propagation logic – Examples

| Op Format                      | Op Semantics                     | Taint Propagation                                             | Description                                     |
|--------------------------------|----------------------------------|---------------------------------------------------------------|-------------------------------------------------|
| <i>const-op</i> $v_A C$        | $v_A \leftarrow C$               | $\tau(v_A) \leftarrow \emptyset$                              | Clear $v_A$ taint                               |
| <i>move-op</i> $v_A v_B$       | $v_A \leftarrow v_B$             | $\tau(v_A) \leftarrow \tau(v_B)$                              | Set $v_A$ taint to $v_B$ taint                  |
| <i>move-op</i> $v_A R$         | $v_A \leftarrow R$               | $\tau(v_A) \leftarrow \tau(R)$                                | Set $v_A$ taint to return taint                 |
| <i>rem</i>                     |                                  | $\tau(\quad)$                                                 | t                                               |
| <i>th</i>                      |                                  | $\tau(\quad)$                                                 |                                                 |
| <i>unary-op</i> $v_A v_B$      | $v_A \leftarrow \otimes v_B$     | $\tau(v_A) \leftarrow \tau(v_B)$                              | Set $v_A$ taint to $v_B$ taint                  |
| <i>binary-op</i> $v_A v_B v_C$ | $v_A \leftarrow v_B \otimes v_C$ | $\tau(v_A) \leftarrow \tau(v_B) \cup \tau(v_C)$               | Set $v_A$ taint to $v_B$ taint $\cup v_C$ taint |
| <i>binary-op</i> $v_A v_B$     | $v_A \leftarrow v_A \otimes v_B$ | $\tau(v_A) \leftarrow \tau(v_A) \cup \tau(v_B)$               | Update $v_A$ taint with $v_B$ taint             |
| <i>binary-op</i> $v_A v_B C$   | $v_A \leftarrow v_B \otimes C$   | $\tau(v_A) \leftarrow \tau(v_B)$                              | Set $v_A$ taint to $v_B$ taint                  |
| <i>aput-op</i> $v_A v_B v_C$   | $v_B[v_C] \leftarrow v_A$        | $\tau(v_B[\cdot]) \leftarrow \tau(v_B[\cdot]) \cup \tau(v_A)$ | Update array $v_B$ taint with $v_A$ taint       |
| <i>aget-op</i> $v_A v_B v_C$   | $v_A \leftarrow v_B[v_C]$        | $\tau(v_A) \leftarrow \tau(v_A[\cdot]) \cup \tau(v_C)$        | Set $v_A$ taint to array and index taint        |
| <i>sput-op</i> $v_A f_R$       | $f_R \leftarrow v_A$             | $\tau(f_R) \leftarrow \tau(v_A)$                              | Set field $f_R$ taint to $v_A$ taint            |
| <i>sget-op</i> $v_A f_B$       | $v_A \leftarrow f_B$             | $\tau(v_A) \leftarrow \tau(f_B)$                              | Set $v_A$ taint to field $f_B$ taint            |
| <i>iput-op</i> $v_A f_R v_C$   | $f_R \leftarrow v_A$             | $\tau(f_R) \leftarrow \tau(v_A) \cup \tau(v_C)$               | Set field $f_R$ taint to $v_A$ and $v_C$ taint  |
| <i>ige</i>                     |                                  | $\tau(\quad)$                                                 | object reference taint                          |

# Data flow control: dynamic analysis, – Limits

## ■ False negatives

## ■ Management of data flows

- Explicit flows

`y = x`

## ■ Do not consider control flows

- Implicit flows

`if (x)`

`y = true`

`else`

`y = false`

# Control dependencies attack

```
1. X = false  
2. Y = false  
3. char c[256];  
4. If( gets(c) != user_contact )  
5. X = true;  
6. else  
7. Y = true;  
8. NetworkTransfer(x);  
9. NetworkTransfer(y);
```

Data leakage

# Our Research topics

## – Solving “under-tainting” problem

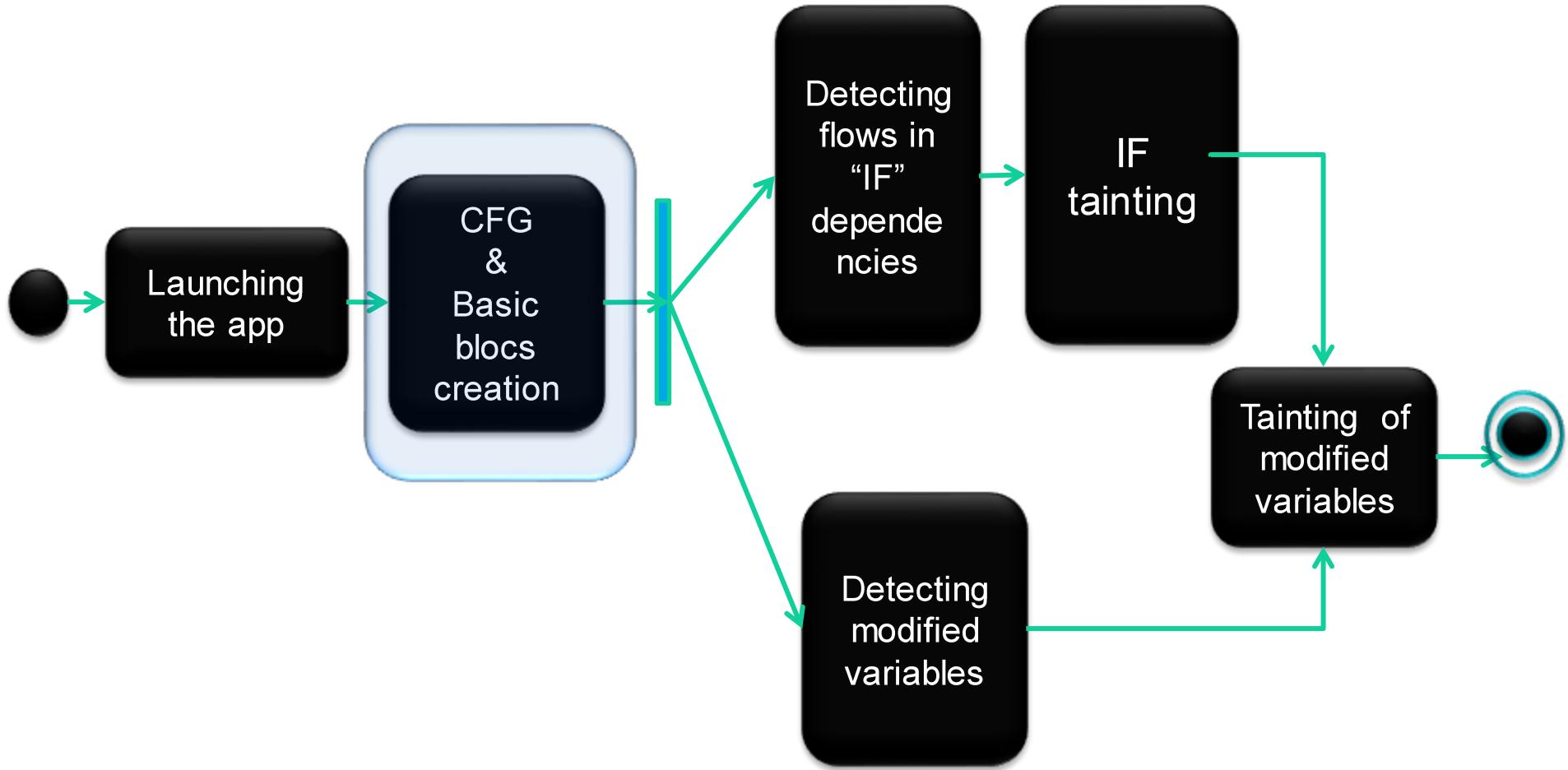
### ■ Leakage using flow control

- *Mariem Graa, Nora Cuppens-Boulahia, Frédéric Cuppens, Ana R. Cavalli: Detecting Control Flow in Smartphones: Combining Static and Dynamic Analyses. CSS 2012*

### ■ Code obfuscation

- *Mariem Graa, Nora Cuppens-Boulahia, Frédéric Cuppens, Ana R. Cavalli: Protection against Code Obfuscation Attacks Based on Control Dependencies in Android Systems. SERE 2014*

# Solving “under-tainting” problem



# New tainting propagation rules

$$(x \rightarrow y) \Rightarrow (Taint(y) \leftarrow Taint(x))$$

$$(x \leftarrow y) \Rightarrow (y \rightarrow x)$$

$$\begin{aligned} & (Taint(x) \leftarrow Taint(y)) \wedge (Taint(x) \leftarrow Taint(z)) \\ & \Rightarrow (Taint(x) \leftarrow Taint(y) \oplus Taint(z)) \end{aligned}$$

*Is modified(x)  $\wedge$  Dependency(x, condition)  $\wedge$  BranchTaken(br, conditionalstatement)*

---

$$Taint(x) \leftarrow Context\_Taint \oplus Taint(explicitflowstatement)$$

*Is assigned(x, y)  $\wedge$  Dependency(x, condition)  $\wedge$   $\neg$ BranchTaken(br, conditionalstatement)*

---

$$Taint(x) \leftarrow Taint(x) \oplus Context\_Taint$$



# Obfuscated code

## ■ IMEI (International Mobile Equipment Identity)

### Dynamic analysis

1.X← User\_Location  
2.NetworkTransfer(X);



1.X ← User\_Location  
2.for each x in X do  
3. For each symbol in  
    AsciiTable do  
4.     If(symbol = x then)  
5.         Y ← Y + symbol  
6.     end if  
7. end for  
8.end for  
9.NetworkTransfer(Y);



# Obfuscated code: Solved!

```
1.X ← User_Location  
2.For each x in X do  
3.    For each symbol in  
        AsciiTable do  
4.        If(symbol = x then)  
5.            Y ← Y + symbol  
6.        end if  
7.    end for  
8.end for  
  
9.NetworkTransfer(Y);
```



# Our Research topics:

## – Detecting flows in native codes

### ■ Instrumenting JNI code to avoid sensitive data leakage

- *Mariem Graa, Nora Cuppens-Boulahia, Frédéric Cuppens, Jean-Louis Lanet: Tracking Explicit and Control Flows in Java and Native Android Apps Code. ICISSP 2016*

```
package com.tuto.attackndk;
public class MainActivity extends
    Activity {
    static {
        System.loadLibrary("attackndk");
    }
    public static native void
        invokeNativeFunction(String IMEI);
    @Override
    protected void onCreate(Bundle
        savedInstanceState) {
        super.onCreate(savedInstanceState);
        setContentView(R.layout.activity_main);
        String device_id =
        GetDeviceId();
        invokeNativeFunction(device_id);
    }
}
```

Attack exploiting native code

```
#include <string.h>
#include <jni.h>
VoidJava_com_tuto_attackndk_MainActivity_invokeNativeFunction(JNIEnv* env, jobject thiz, jstring IMEI) {
    String Private_Data;
    String Z;
    strcpy(Private_Data, IMEI);
    for(int i = 0; i < sizeof(Private_Data); i++)
    {
        char s;
        sprintf(s, "%d", i);
        for(int j = 1; j < sizeof(TabAsc); j++)
            if(strcmp(s, TabAsc[j]) ==
            0)
                strcat(Z, TabAsc[j]);
    }
    NetworkTransfer(Z);
}
```

Native malicious function

# Our Research topics

## – Side channel attacks

### ■ Dealing with different side channel attacks

- *Mariem Graa, Nora Cuppens-Boulahia, Frédéric Cuppens, Jean-Louis Lanet, Rouda Moussaileb: Detection of Side Channel Attacks Based on Data Tainting in Android Systems. SEC 2017*

```
X ← Private_Data
for each  $x \in X$  do
    n ← CharToInt( $x$ )
    StartTime ← ReadSystemTime()
    Wait( $n$ )
    StopTime ← ReadSystemTime()
    y ← (StopTime – StartTime)
    Y ← Y + IntToChar( $y$ )
end for
Send Network Data( $Y$ )
```

### ■ Timing attack example

- Enrich the tainting policy rules
- The system clock is sensitive



# Our Research topics

## – Hijacking attacks

### ■ Detecting activity hijacking

- *Anis Bkakria, Mariem Graa, Nora Cuppens-Boulahia, Frédéric Cuppens, Jean-Louis Lanet. Experimenting similarity-based hijacking attacks detection and response in Android Systems ICISS'2017*

### ■ Android users Activities require to communicate sensitive data

- passwords, security codes, and credit card numbers) with applications

### ■ Hacker can launch hijacking attacks to compromise user's data confidentiality / privacy

### ■ [Chen et al.] stealthily inject into the foreground a hijacking activity at the right timing and steal sensitive information in Android smartphones

# Our Research topics

## – Hijacking attacks

- **The core security mechanisms of Android cannot detect activity hijacking**
- **Some not satisfactory existing work**
  - [Malisa et al.] and [Sun et al.] analyse application resource files (XML layout) to detect similarity of UI
- **Our proposal**
  - Modify the Android operating system
  - Extract and compare UI elements features of the legitimate and the hijacking interfaces
  - Use the indistinguishability level between the attack and legitimate Activities
  - Reacting: blocking or alerting

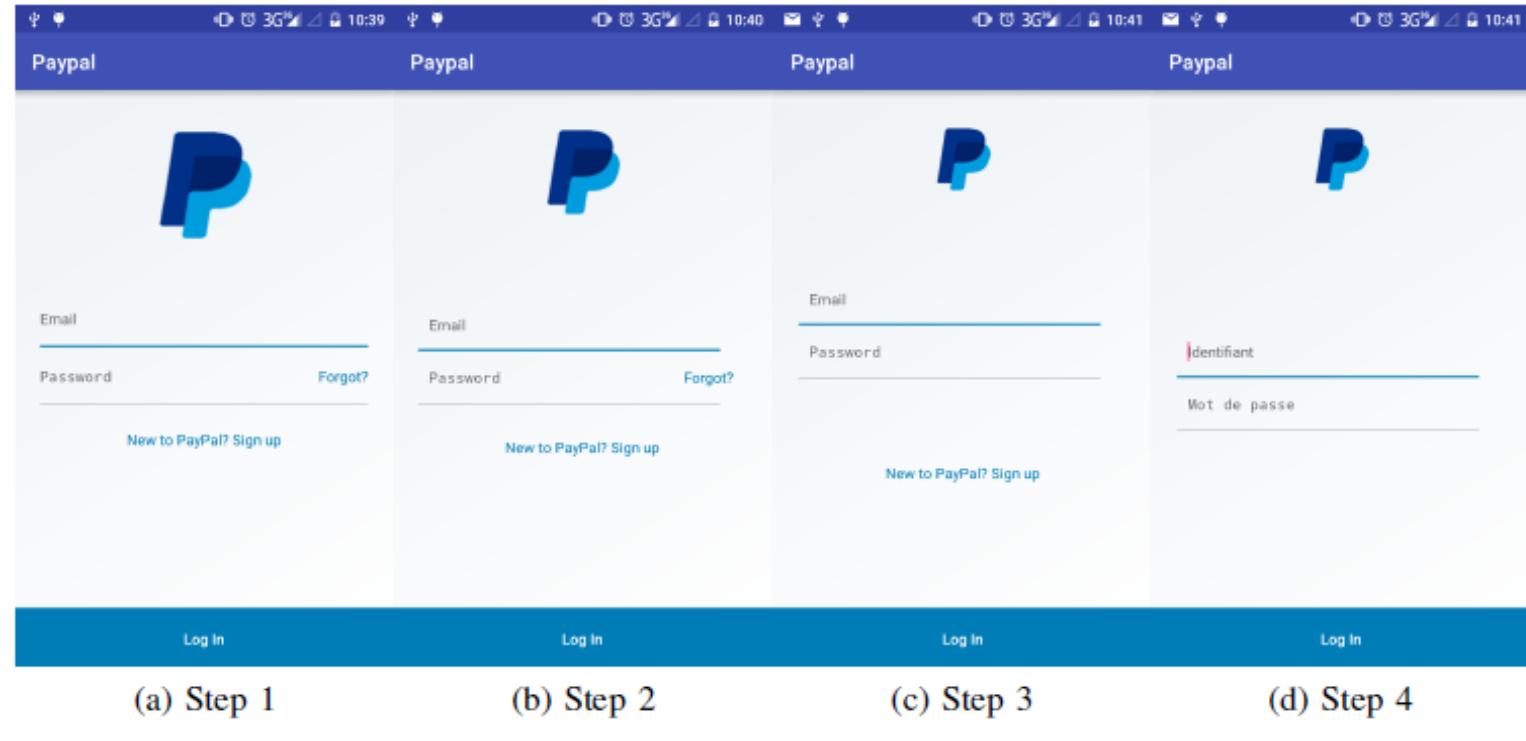
# Our Research topics

## – Hijacking attacks

### ■ False positives

- 4.2% in the case of partial indistinguishability
- $10^{-3}$  % in the case of full indistinguishability

### ■ Performance: 0.39% performance overhead on a CPU-bound micro-benchmark



# Conclusion

- **Malicious and behaviour in smartphone platforms has evolved significantly in the last decade**
  - Android particularly
- **It currently target Internet of Things devices**
  - Many open research problems in this context
    - Privacy of course,
    - But also Trust and Security that need to be revised



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# **Confidentiality violations detection in Android systems**

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*Colloque IMT'2017, November 10<sup>th</sup>*

