

# Uncovering the Dilemmas on Antivirus Software Design in Modern Mobile Platforms

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**Abstract.** With the rapid increase in Android device popularity, a new evolving arms-race is happening between the malware writers and AntiVirus Detectors (AVDs) on the popular mobile system. In its latest comparison of AVDs, independent test lab AV-TEST reported that AVDs have around 95% malware recognition rate. However, as mobile systems are specially designed, we consider that the power of AVDs' should also be evaluated based on their runtime malware detection capabilities. In this work, we performed a comprehensive study on ten popular Android AVDs to evaluate the effectiveness of their scanning operations. During our analysis, we identified the design dilemmas related to two types of malware scanning operations, namely *local* malware scan and *cloud-based* malware scan. Our work opens a new research direction in designing more effective and efficient malware scan mechanisms for current antivirus software on mobile devices.

**Keywords:** Android · Antivirus · Malware · Mobile attacks

## 1 Introduction

The increasingly popularity of mobile computing devices (e.g., smartphones and tablets) attracts both normal users and malware writers. Among the popular mobile platforms, Android has not only conquered a lion's share of the market, but also gained the 98.1% share of detected mobile malware in 2013 [3]. Therefore, being aware of the notorious fact of mobile malware shares, many reputable companies on PC security as well as new startups have turned their attention to mobile-platform security and released their antivirus detectors (AVDs) particularly for Android [1]. Here, an AVD generically refers to the signature-based antivirus detector that is deployed on mobile devices.

For AVDs on desktop and server systems, earlier work has studied the impact of polymorphic attacks [16] or file format confusion based attacks [15] on the malware scanning operation. Recently, the real world polymorphic attacks have also been reported [4] and further studied [22] for Android AVD evasion. In the era of mobile computing, a new evolving arms-race is going on between the malware writers and the AVDs. The AVD based on dynamic behavior or

other dynamic heuristics are comparatively hard to be deployed on the battery constrained mobile devices. Also, because of the centralized software distribution on Google Play, static signature based malware fingerprinting scheme gains great values, since the potential malware spreading sources are very limited (users are not suggested to install apps from untrusted sources).

Every three months, the independent AVD test lab AV-TEST generates a report [2], comparing the detection rate and usability of Android AVDs. The latest report indicates that the popular AVDs under test achieve an average detection rate of around 95% for known malicious app samples. However, since apps are allowed to dynamically load code from external sources at runtime [21], when combined with repackaging techniques [7, 14, 29], malware writers demonstrates [31, 32] that more advanced malware can be easily created to perform targeted attacks. Therefore, the success of the AVD's malware scan should also be measured based on its real-time detection of advanced malware.

Hence, we conduct an empirical study of ten Android AVDs on two types of malware scan operations, namely the *Local-malScan* and the *Cloud-malScan*. Our analysis result indicates that both *malScan* operations have fundamental design deficiencies. Therefore, AVD vendors should consider the design of malware scanner on Android more thoroughly.

## 2 Antivirus Detectors on Android Platform

In this section, we first briefly introduce some necessary background on Android Antivirus Detectors (AVDs), and then explain how we conduct the empirical study towards further understanding of the design characteristics of the current AVDs. Our analysis, particularly focuses on the real-time detection capability of the AVDs deployed on Android. More comprehensive discussions on Android security mechanisms can be found in Yan and Yin [26] and Enck et al. [11].

**Table 1.** Popular Antivirus Detectors (AVDs) in Our Study

ID	Vendor	AVD package name & version #	Downloads #
1	Avast	com.avast.android.....3.0.6915	50M-100M
2	AVG	com.antivirus.....3.6	100M-150M
3	Avira	com.avira.android.....3.1	1M-5M
4	Bitdefender	com.bitdefender.security.2.8.217	1M-5M
5	Kaspersky	com.kms (premium).....11.2.3	5M-10M
6	ESET	com.eset.ems2.gp.....2.0.843	1M-5M
7	Dr. Web	com.drweb.pro.....7.00.11	10M-50M
8	Lookout	com.lookout.....8.28-879ce69	50M-100M
9	McAfee	com.wsandroid.suite.....4.0.0.143	5M-10M
10	Norton	com.symantec.mbsec.....3.8.0.12	10M-50M

Android is an operating system based on the Linux Kernel, with new features such as the Binder IPC mechanism, Power Manager and Ashmem mechanism and etc. On top of the Linux kernel, Android is loaded with four software layers, namely System Libraries, Android Runtime, Application Framework and Application. In addition to the native Linux basic discretionary access control mechanism and the SEAndroid [24] mechanism based on Linux Security Module, Android provides a fine-grained permission mechanism for all the apps running on the Application layer, including all the AVDs from third party vendors. Table 1 lists ten popular AVDs in Google Play as of Feb. 2014. The popularity of these AVDs is reflected by their overall protection rankings, according to AV Test Reports [2] for the period of Sept. 2013–Jan. 2014.

**Table 2.** Intents Registered and Permissions Asked by AVDs

Intents Registered	#	Permissions Requested	#
intent.action.MEDIA_REMOVED	1	android.permission.SUPERUSER	2
intent.action.MEDIA_CHECKING	3	android.permission.BATTERY_STATS	3
intent.action.PWR_DISCONNECTED	3	android.permission.google.c2dm.RECEIVE	3
intent.action.WIFI_STATE_CHANGED	4	android.permission.KILL_PROCESSES	4
intent.action.DATE_CHANGED	4	android.permission.COARSE_LOCATION	4
intent.action.SERVICE_STATE	4	android.permission.ALERT_WINDOW	5
intent.action.DIAL	5	android.permission.WRITE_BOOKMARKS	5
intent.action.MEDIA_UNMOUNTED	6	android.permission.GET_ACCOUNTS	6
intent.action.POWER_CONNECTED	6	android.permission.READ_SMS	7
intent.action.net.wifi.STATE_CHANGE	7	android.permission.READ_BOOKMARKS	7
intent.action.MEDIA_EJECT	7	android.permission.READ_CONTACTS	8
intent.action.USER_PRESENT	7	android.permission.RECEIVE_SMS	8
intent.action.ACTION_SHUTDOWN	7	android.permission.SEND_SMS	8
intent.action.NEW_OUTGOING_CALL	9	android.permission.READ_LOGS	9
intent.action.PHONE_STATE	10	android.permission.GET_TASKS	10
intent.action.PACKAGE_REPLACED	10	android.permission.WAKE_LOCK	10
intent.action.PACKAGE_REMOVED	10	android.permission.EXTERNAL_STORAGE	10
intent.action.PACKAGE_ADDED	10	android.permission.READ_PHONE_STATE	10
intent.action.BOOT_COMPLETED	10	android.permission.BOOT_COMPLETED	10

Generally, Android uses a standard template process called Zygote, which is the parent process for all the Android DVM processes, including all the AVDs' main processes. Each AVD is assigned its own unique user ID (UID) at the install time, and the access control bits for the relevant files and folders in the file system are then set accordingly by the system. The dedicated group ID (GID) numbers are assigned based on the requested permissions for the Android system resources. Also, various system daemons and apps are classified into different access control domains in the SEAndroid policy rules, in order to provide better isolation and security.

An AVD registers itself to specific broadcast intents by programmatically registering a broadcast receiver in the code or claiming the relevant receivers in

the file `AndroidManifest.xml`. For example, an AVD may register for the system generated intents `BOOT_COMPLETED`, which is fired by the system once the boot process is completed. This enables the AVD to keep track of some system events of interest that are happening and then take appropriate actions.

In Table 2, the left two columns list the types of Intent actions and how frequently they are registered by the ten AVDs in our study, and the right two columns list the types of permissions and how frequently they are requested by these AVDs. From the table, it seems that the current AVDs can provide a very good real-time protection. For instance, all these AVDs listen to `BOOT_COMPLETED` system event to provide complete protection after the system boots up and obtain the `WAKE_LOCK` permission to periodically wake up the CPU to keep monitoring the system status. Also, events like `PACKAGE_ADDED` and `PACKAGE_REMOVED` are mostly registered to help monitor the newly installed or updated Android application package (APK) files.

### 3 Dilemmas for Malware Scan Design

#### 3.1 Local Malware Scan Dilemma

*Scan the Archived Files or Not?* Our study shows that current Android AVDs have designed a comprehensive local malware scan (local-malScan), which is a thorough scan carried out on the pre-selected (sub)directories, which usually includes operations like file preprocessing and malware signature fingerprinting. Due to the power or other resource constraints, the local-malScan usually does not perform thorough file preprocessing on the files with specific formats (e.g., the archived files). Therefore, the malicious payload can be simply zipped and dropped on the file system without being identified. While some AVDs perform comprehensive scan by uncompressing the archived format files, we discover that one can construct a multi-layered archive file to conduct denial of service attacks and drain the device battery, since the scanner will keep unzipping every inner zip file in the multi-layered archive file diligently. As such, whether to preprocess or scan the special formatted files is a dilemma on current resource restricted AVD on mobile platforms.

*Update the Virus Definition File or Not?* During our comprehensive analysis, we discover an interesting *probing channel*. Almost all the AVDs will have the VDF file and other permanent data or cached files stored in the subdirectory at `/data/[AVD_package]/*`. These files are set to be “world unreadable” and enforced by Linux kernel in Android using access control policies. We find that this solid design of app data privacy protection is not enough for AVD deployment, since an adversary only needs to know the file sizes or other meta-data information of relevant files (e.g., creation and update time) in the subdirectory to infer the updating status of these files. During our analysis, we discover that by using the `/system/bin/ls` program, or writing a dynamic library which calls the `stat()` system call, one can directly probe the meta-data information of all these “world unreadable” files in an AVD’s data folder. This design deficiency

can potentially be leveraged to design on-demand malware polymorphism. Basically, whenever the anti-AVD app detects a VDF-update, which might contain the signature to fingerprint its current malicious payloads, it can update its payloads using a new polymorphic strategy. Therefore, the adversary will enjoy this on-demand VDF-update feature and is always one-step ahead of the AVD's static fingerprinting. Hence, whether to perform the VDF update is another dilemma for current AVD Local-malScan.

### 3.2 Cloud Malware Scan Dilemma

*To Offload or Not to Offload?* Due to the limitation of the on the Local-malScan, we sense a trend of adding the cloud-based scanning strategy for mobile platform during our analysis. Cloud-based scan (Cloud-malScan) is generally believed to be suitable for resource limited mobile devices, as it can offload the heavy computation to a remote server by sending out the collected information, including the file hashing value, the meta-data of a file etc. However, since the per UID network usage statistics can also be probed in “/proc/uid\_stat/[AVD\_uid]/snd(rcv)” an adversary can plan evasions against AVDs by identifying the network sending and receiving statistic pattern of Cloud-malScan. So we find that the implicit dilemma in the Cloud-malScan is whether to send enough file information to the remote server for further signature mapping and scanning. If the Cloud-malScan on the local device tries to collect less information to send out (e.g., only the file hash value or the file meta-data), then the malware scan/detection performed on the server can merely based on simple signature fingerprinting. However, if the Cloud-malScan collects more information (e.g., execution traces) to offload to remote server for deep (behavior based) analysis, its network statistics become more identifiable and is vulnerable to targeted evasions (e.g., the malicious payload will be loaded only after the Cloud-malScan performed on the device).

## 4 Related Work

**Antivirus evasion techniques** [5,15,16] have been studied previously. Oberheide et al. [17] has also generally discussed challenges in deploying antivirus detectors (AVDs) on mobile platforms. Android Dalvik Bytecode polymorphic transformation attacks have been presented by Rastogi et al. [22]. Our new evasion techniques exploit the cloud-based malware scanning behavior of the AVDs, and they are complementary to obfuscation-based or other evasion techniques, which are similar to the other attacks discussed in [12].

**Malware and intrusion analysis techniques** [10,11,13,26] have been designed and applied for offline analysis. Also, various interesting anti-analysis technique have been discussed [9,19] for malware on both mobile and PC. Our anti-AVD app design is conceptually similar to anti-analysis techniques, but we emphasize more on the evasion of AVD's online protection mechanism. Zhou et al. [32] provide a survey of Android malware, and similarly, the discovered

design dilemmas in this paper are based on a systematic survey of ten popular Android AVDs.

**Side/timing channel** issue [8, 18, 23, 25, 30] is also an active research aspect in both mobile and PC era. The network based probing and fingerprinting based attacks for the AVD deployed on the mail server side have been explored by Oberheide et al. [18], also including the reconnaissance and action phases. Information hiding techniques have been discussed by Petitcolas et al. [20]. Side channel/timing channel preventions have been discussed in several papers [6, 27, 28]. Generally, it is one of the toughest challenges in computer security. Zhang et al. [28] provides the language-based control and mitigation for the timing channels.

## 5 Conclusion

Through an empirical study of ten top AVDs on the current Android platform, we identified several design dilemmas in the malware scan operations, including the local malware scan and the cloud-based malware scan. These dilemmas are related to the malware scan of the archived or other special formatted file, the virus definition file update, and the offloading file sizes of the cloud-based malware scan, and pose challenges in antivirus software design in the current Android platform. Through this study, we open a new research topic on how to improve the effectiveness and efficiency of current malware scan and detection on current mobile platforms.

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