

SMASheD: Sniffing and Manipulating Android Sensor Data for Offensive Purposes

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Abstract—The current Android sensor security model either allows only restrictive read access to sensitive sensors (e.g., an app can only read its own touch data) or requires special install-time permissions (e.g., to read microphone, camera, or GPS). Moreover, Android does not allow write access to any of the sensors. Sensing-based security and non-security applications, therefore, crucially rely upon the sanity of the Android sensor security model. In this paper, we show that such a model can be effectively circumvented. Specifically, we build *SMASheD*, a legitimate framework under the current Android ecosystem that can be used to stealthily sniff as well as manipulate many of the Android's restricted sensors (even touch input). *SMASheD* exploits the Android debug bridge functionality and enables a malicious app with only the INTERNET permission to read, and write to, multiple different sensor data files at will. *SMASheD* is the first framework, to the best of our knowledge, that can sniff and manipulate protected sensors on unrooted Android devices, without user awareness, without constant device-PC connection and without the need to infect the PC. The primary contributions of this paper are twofold. First, we design and develop the *SMASheD* framework, and evaluate its effectiveness on multiple Android devices, including phones, watches, and glasses. Second, as an offensive implication of the *SMASheD* framework, we introduce a wide array of potentially devastating attacks. Our attacks against the touch sensor range from accurately logging the touch-screen input (*TouchLogger*) to injecting touch events for accessing restricted sensors and resources, installing and granting special permissions to other malicious apps, accessing user accounts, and authenticating on behalf of the user—essentially almost doing whatever the device user can do (secretively). Our attacks against various physical sensors (motion, position, and environmental) can subvert the functionality provided by numerous existing sensing-based security and non-security applications, including those used for (continuous) authentication, authorization, safety, and elderly care.

Index Terms—Authentication, computer security, permissions.

I. INTRODUCTION

SENSING-ENABLED computing is rapidly becoming ubiquitous. With mobile device manufacturers embedding multiple, low-cost hardware sensors onto the devices and mobile OS providers adding full software support for developing applications using these sensors, there is a transformational growth in the adoption of mobile devices.

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The most common categories of sensors available on the current breed of mobile devices, smartphones, smartwatches and smartglasses, include: (1) *user input sensor* (touchscreen and hardware buttons), (2) *audio-visual sensors* (microphone and camera), (3) *navigational sensors* (e.g., GPS), (4) *motion sensors* (e.g., accelerometer and gyroscope), (5) *position sensors* (e.g., magnetometer and proximity), and (6) *environmental sensors* (e.g., pressure, and temperature). The mobile apps utilizing these sensors have seen a widespread deployment in many domains ranging from entertainment, navigation and transportation (e.g., [16]) to elderly care (e.g., [10], [12]) and safety (e.g., [39]), to name a few. In addition, mobile device sensors are a cornerstone of a wide range of security and privacy applications, including those geared for authentication and authorization (e.g., [13], [14], [25], [31]).

Since mobile sensors provide potentially sensitive information about the host device, the device's user or the device's surroundings, protecting sensor data from abuse by malicious applications becomes paramount. Consequently, most mobile platforms have established a sensor security access control model. Specifically, Android, one of the most popular mobile OSs and the subject of this paper, follows a model where read access to many sensitive sensors is very restrictive (e.g., an app can only read its own touch data) or requires special install-time permissions granted by the user (e.g., to access microphone, camera or GPS). The read access to most other sensors, including motion, position and environmental sensors, is not restricted within this model because Android may not consider these sensors as explicitly sensitive. Moreover, Android security model does not allow write access to any of the sensors [1]. Clearly, the sensing-based security and non-security applications therefore crucially rely upon the sanity of the Android sensor security model.

In this paper, we demonstrate that the current Android sensor security model can be effectively circumvented to a large extent. Specifically, we build *SMASheD*, a legitimate systems framework under the current Android ecosystem that can be used to stealthily sniff (read) as well as manipulate (write to) many of the Android's restricted sensors. To be precise, *SMASheD* can be used to: (1) directly sniff the touchsensor, (2) directly manipulate the touch, motion, position and environmental sensors, and (3) indirectly, using the touch inject capability, sniff the audio-visual and navigational sensors. *SMASheD* does not require the device to be rooted.

SMASheD exploits the Android Debug Bridge (ADB) functionality and enables a malicious app with only the INTERNET permission to read from, and write to, multiple sensor data files at will. ADB is a functionality designed to allow Android app developers with extended permissions

to systems resources that are otherwise protected by the Android sensor security model. This workaround is legitimate and has been used by many apps in Google Play Store such as screenshot apps [18], sync and backup apps [8], and touch record/replay apps [34]. All of these apps ask the user to connect her device to a PC via USB, launch ADB and run a native service with ADB privilege. The app then communicates with this service to obtain access to the resources which Android deems as protected.

As part of *SMASheD*, we develop a service that provides read and write sensor events functionality. This functionality can be hidden inside any service that requires the ADB workaround, e.g., a screenshot service. When installing an app, the user is usually made aware of the permissions that she is granting to the app. However, while installing and executing the service through ADB, the user is completely oblivious as to what permissions the service might have. Also, *SMASheD* can be published for debugging or any other benign purposes but can contain malicious code that will utilize the functionality provided by the service for malicious purposes. Moreover, such services can be exploited by malicious apps in a similar way as presented in [20]. Our *SMASheD* platform encompasses a native service and an Android app.

Our Contributions: In this paper, we expose the vulnerability underlying the ADB workaround allowing us to read from and write to many Android sensors currently protected by the Android access control model. Equipped with this powerful capability, we then go on to present the offensive implications in many security and non-security contexts. The research contributions of our work are outlined below:

- 1) **A Framework to Sniff & Manipulate Android Sensors** (Section III): We design and develop the *SMASheD* framework to sniff and manipulate many restricted Android sensors, and evaluate its effectiveness on multiple Android devices, including phones, watches and glasses.
- 2) **Powerful Adversarial Applications** (Section IV): As a significant offensive implication of the *SMASheD* framework, we introduce a broad array of potentially devastating attacks. Our attacks include the following (selected attack demos are available at <https://androidsmashed.wordpress.com/demos/>):
 - a) Logging the touchscreen input, leading to the first full-fledged, highly accurate *TouchLogger*.
 - b) Injecting touch events for accessing restricted sensors and resources (e.g., microphone, camera or GPS), installing and granting special permissions to other malicious apps (translating into many known malware schemes, such as [27], [35], and [36], without the need for the user to grant special permissions), accessing user accounts and authenticating on behalf of the user – essentially *almost doing whatever the device user can do* (secretively).
 - c) Manipulating various physical sensors (motion, position and environmental) in order to subvert the functionality provided by many sensing-based

security and non-security applications, including those used for (*continuous*) authentication (e.g., [13], [14]), authorization (e.g., [30], [31]), safety (e.g., [39]), and elderly care (e.g., [10], [12]).

This paper is an extension of our previous work [23]. In this extension, we provided a comprehensive implementation of seven of the attacks, extend the scope of our attacks to non-security applications including those used for safety, elderly care and video authenticity, and tested *SMASheD* on various android devices.

II. BACKGROUND: ANDROID SENSOR SECURITY MODEL

Android's core security principle is to protect user data, system resources and apps from malicious apps [1]. Android utilizes the Linux approach of process isolation to enforce the isolation of apps and operating systems components. This isolation is achieved by assigning each app a unique User Identifier (UID) and Group Identifier (GID) at the app installation time. Therefore, each app is enforced to run in a separate Linux process, called *Application Sandbox*, and the Linux process isolation ensures that an app cannot interfere with other apps or access system resources unless permissions are explicitly granted. In order to allow apps to communicate with each other and access system resources, Android provides a secure Inter-Process Communication (IPC) protocol.

Discretionary Access Control (DAC) is the typical access control employed in Linux. In DAC, the owner/creator of the data sets the access permissions of the data to three types of users: the owner, the users in the same group and all other users. When an app is installed, Android creates a home directory for the app (i.e., /data/data/app-name) and allows only the owner to read from and write to this directory. The apps signed with the same certificate are able to share the data among each other.

File system permissions are also used to restrict the access of system functionality. For example, /dev/cam permission is set to allow only the owner and the users in the camera group to read and write to the camera sensor. When an app requests the CAMERA permission, and if the permission is granted, the app is assigned the camera Linux GID, which would allow it to access /dev/cam. The mapping between the Linux groups and permission labels are set in platform.xml, and ueventd.rc is responsible for setting the owners and groups for various system files.

Some Android resources do not require any permission. In particular, reading motion, position and environmental sensors is globally permitted. Most of the other resources require read-write permissions, and these permissions have four levels:

- 1) *Normal*: The app needs to request the access, however, the system grants the permission automatically without notifying the user (e.g., vibrate).
- 2) *Dangerous (protection level 1)*: The system grants the permission to the app only if the user approves granting this permission (e.g., accessing camera, microphone, or GPS).
- 3) *Signature (protection level 2)*: The system grants the permission to the app only if the requesting app is signed

with the same certificate as the app that declared the permission, without notifying the user. (e.g., allowing two apps signed by the same developer to access each other components, inject event).

- 4) *SignatureOrSystem* (protection level 3): The system grants the permission only to the apps that are in the Android system image or that are signed with the same certificate as the app that declared the permission (e.g., system reboot).

In any Linux system, an executable runs with same permission as the process that has started it. ADB shell is already assigned to several groups (graphics, input, log, adb, sdcard_rw, etc). Therefore, any executable that starts through the ADB shell is granted the same level of access to the resources which belong to any of these groups. Since the directory “/dev/input/*” which contains the sensor files, belongs to “input” group, and the ADB shell has read-write access to all the resources associated with “input” group, any executable that is initiated by ADB shell can read from and write to the “/dev/input/*” resources. This is the key idea upon which our *SMASheD* framework is based, allowing us to sniff and manipulate many of the Android’s sensors.

III. SMASHED DESIGN, IMPLEMENTATION AND THREAT MODEL

A. Design Overview

As mentioned in Section II, the current Android security model considers many resources as sensitive and thus limits the access of these resources only to the apps that are signed by the system (protection level 3 for the permissions declared by the system and protection level 4). These protected resources include: injecting user events into any window (INJECT_EVENTS), taking screen shots (READ_FRAME_BUFFER), and reading system log files (READ_LOGS). However, Android allows access to these resources through the ADB shell for development purposes, by assigning the ADB shell to the groups that can access these resources. For example, the ADB shell is assigned to the input group which allows any process with the ADB shell privilege to read from and write to any of the files in the /dev/input/ directory. This directory contains the files associated with user input, motion, position and environmental sensors.

Moreover, Android’s current directory structure has the /data/local/tmp/ directory which is assigned to shell user and shell group, and gives read, write and execute permission to the shell user and any user in the shell group. This folder allows the user to run executable files on their Android devices through ADB shell.

Many developers have exploited these capabilities given to the ADB shell to grant permissions to their apps that are not otherwise allowed. This ADB workaround is performed by developing a native service, pushing it into the /data/local/tmp/ directory and running the service through the ADB shell. This way the native service grants all the permissions that are granted to the shell. Finally, to allow other apps to communicate with the service, both the app and the service open sockets and communicate through it. This approach has

been utilized by many apps that are already published in Google Play Store such as apps that allow the users to take screenshots programmatically [18], sync and backup [8], USB tethering [7], and touch record/replay [34].

The above design allows any app with only the INTERNET permission to communicate with the service. Hence, the app with only the INTERNET permission will obtain access to the resources that the service provides *without the user’s knowledge*. This vulnerability has been explored in [20], focusing mainly on screenshot apps published in Google Play Store. The authors developed an app, Screenmilk, which communicates with the native services of many screenshots apps. They showed that Screenmilk is able to collect user’s sensitive data, such as user’s credentials on many banking apps by sending requests to the screenshot’s native service to take screenshots while the user is inputting her credentials. (A detailed comparison of our *SMASheD* framework with related prior work is later provided in Section VI and Table I).

In this paper, we are exploring and extending this vulnerability further, and with potentially much broader consequences. We focus on INJECT_EVENTS permission. There are already some apps in Google Play Store, such as *FRep* – Finger Replayer [34], which allow users to record their touch interactions with their devices and replay them later. *FRep* has already been installed by 100,000 to 500,000 users. These apps also utilize the ADB workaround, similar to the screenshot apps, in order to gain access to the read and inject touchscreen data. Also, as the communication between the touch repeater app and its native service is done through a socket, the native service becomes accessible to any app installed on the phone with only the INTERNET permission. Therefore, if the user installs any malicious apps with the INTERNET permission, these apps can also communicate with the service and read/inject touch events maliciously.

RERAN [15] presents one of the benign use cases for the apps that record and later replay sensor events by injecting the events into the sensors. Such apps enable the developers to test their apps and reproduce errors. However, rather than implementing a native service for recording and replaying the sensor events, RERAN employed a different methodology for implementing their app. First, the user needs to connect her device to the PC. Then, she launches a terminal and executes the ADB *getevent* command. This command reads the sensor events and stores them in a file. Finally, the user pushes the file along with a native service to her device and runs the service. This service reads the sensor events from the file and injects them to their corresponding sensors. Once the phone is disconnected from USB, the service stops running.

We implement the *SMASheD* framework which encompasses three components: *SMASheD* server: a native service that provides the sensor data reading and injection capabilities, scripts: two simple scripts used to copy the *SMASheD* server to the device and to start the server, and *SMASheD* app: an app that runs a status detection module in the background, and depending on the phone’s status and the desired functionality, it sends requests to the *SMASheD* server to read or inject sensor events. Figure 1 depicts the overall *SMASheD* architecture.

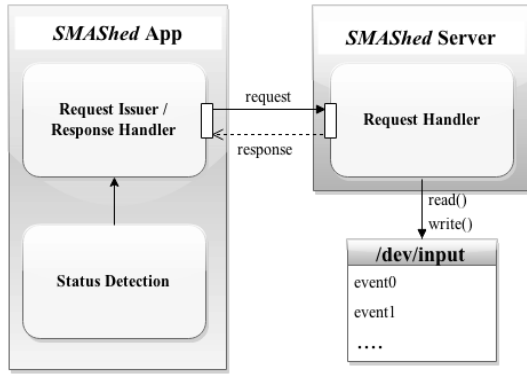


Fig. 1. The architecture of *SMASheD*

B. *SMASheD* Server

Our system works with the sensors whose events are made available to apps through low-level event interface and have files under the directory `/dev/input/`, and not through system services (e.g., camera, microphone, and GPS). This includes user input, motion, position and environmental sensors. For each of these sensors, a corresponding file named `eventx` exists in the directory `/dev/input/`. Android allows reading and injecting sensor events through ADB commands *getevent* and *senedevent*, respectively.

Each hardware event generates multiple input events. Each input event encompasses *time*, *type*, *code* and *value*.

- *time* represents the time at which the event occurred.
- *value* represents the value of the event.
- *code* is the event code and it precisely defines the type of the event. For example, `REL_X`, `REL_Y`, `REL_Z` represent relative changes in X, Y and Z axes, respectively.
- *type* is the event type, which groups the event's codes under a logical input construct. Each event type has a set of applicable event codes. For example, `EV_ABS` represents the absolute axis value changes, `EV_REL` represents the relative axis value changes. A special event type, `EV_SYN`, is used to separate input events into packets of input data changes occurring at the same moment in time.

For a complete list of the applicable events' types and codes, we refer the reader to `linux/input.h`.¹

As an example, a simple touchscreen press-release event generates around 19 input events. Listing 1 in Appendix displays a sample output of executing *getevent* command, pressing on the screen at point (946,1543), and then releasing the touch. `BTN_TOUCH DOWN` and `BTN_TOUCH UP` indicate the beginning and the end of the touch, `ABS_MT_POSITION_X` and `ABS_MT_POSITION_Y` represent the touch's x and y positions, respectively.

We implemented a native service designed in C with code similar to Android's *getevent* and *senedevent* for reading and injecting the sensor events. First, the service scans `/dev/input/` directory to find out what sensors are available in the device. Although the file names in the directory are `event0`, `event1`, etc,

we use *EVIOCGVERSION* *ioctl* function to retrieve the name of the sensor that corresponds to each file. To read from and write to the sensors' files, we use *read()* and *write()* functions.

To allow other apps to communicate with the service, the service creates a socket. The socket keeps on listening to the incoming requests. In the current implementation, the service accepts three kinds of requests: *read*, *stop* and *inject*.

- *read*: The service reads the input events from all the sensors. We can limit the read to a subset of sensors to improve the efficiency. The service continues reading until it receives a *stop* request.
- *stop*: The service stops reading the sensor events. Then, it either writes the events to a file, and sends the file name as a response to the request or sends all the read input events.
- *inject*: Inject needs to have a file name or a list of sensors events as an argument. The service injects the sensors events in the incoming list or in the file to their corresponding sensors files.

C. Scripts

We wrote two shell scripts to start the service. The first shell script is responsible for pushing the native service and the second script to `/data/local/tmp/` folder on the device, and for starting the second script. The second script starts running the service. In this way, the service will run with the same privileges as the shell user. The service will then keep running until the phone is switched off or it gets killed by the user.

D. *SMASheD* App

We implemented an Android app, which only requires the `INTERNET` permission. The app connects to the *SMASheD* server through socket and sends requests to *read* and *inject* events. For example, it may send *read* touch events when a banking app is open to retrieve the password input by the user.

In order to determine whether a specific app that the attacker might be interested in is running, our app has a service that starts when the app is launched and keeps running in the background. The service runs *ps* command periodically, every 100 ms, until the app that the attacker is interested in is launched (status detector shown in Figure 1). Once the app under attack is running and on the foreground, *SMASheD* app connects to the *SMASheD* server through socket and sends *read* request with the list of sensors (e.g., touchscreen data only, all sensors, etc). Once the user exits the app or moves out of the app, *SMASheD* app sends *stop* request to the *SMASheD* server. In case the purpose of reading is to replay the sensor events later in the same device, to reduce the communication between the *SMASheD* server and app, the *SMASheD* server stores the read events in a file and only sends the file name to the *SMASheD* app. Otherwise, the *SMASheD* server sends all the sensor events.

Also, the *SMASheD* app can send *inject* request along with a list of sensor events to inject or a file name previously acquired from the service, whenever it wants to inject sensor events.

¹<https://github.com/torvalds/linux/blob/master/include/uapi/linux/input.h>

E. Threat Model

Our threat model is highly realistic, facilitated under three scenarios:

- 1) **Already Installed Benign ADB Services:** Apps that read and inject touch events (e.g., FRep [34]) are already available in Google Play Store and installed by many users. Given such an already installed benign app, our attacks that read/inject touch events work under the exact same threat model as [20] by using a malicious app that communicates with the service associated with the already installed app.
- 2) **Future Benign ADB Services:** Benign developers can publish an app/service that reads/injects sensors events for providing some benign functionality (e.g., debugging or testing). Once such an app is installed, attacker will launch our attacks similar to [20].
- 3) **Malicious ADB Services:** The attacker can create a benign-looking (malicious) screenshot app, adding read/inject sensor events functionality to its service. The attacker just needs to fool users into installing this app. Note that when user installs a service using ADB, he/she is not notified about the resources the service is accessing. Therefore, the user will not be able to differentiate between services that only take screenshots from services with added malicious functionality. Moreover, if the attacker can gain physical access to an unlocked Android device, the attacker can quickly install the malicious service on the device (e.g., in a lunch-time attack) [26].

The first and second threat model scenarios exploit the vulnerability of the services that expose their ADB functionalities to all the apps installed on the same device with INTERNET permission (same as [20]). The last scenario exploits Android's vulnerability of granting all the shell privileges to any service installed via ADB *without notifying the user*.

SMASheD works on unrooted devices, and does not require an infected PC (unlike [17]) or a constant connection between the device and a PC (e.g., unlike monkeyrunner).²

F. SMASheD Advantages

The SMASheD framework has several advantages:

- **Modularity and Expandability to Broad Attacks:** Once the user runs the script via the ADB shell to install the SMASheD server, the device becomes vulnerable to the attacks described in Section IV. The attacker only needs to modify the SMASheD app so as to send the *read* and *inject* requests according to the type of attack he wants to perform.
- **Stealthiness:** SMASheD is very stealthy and hard to get detected by anti-malware or intrusion detection systems. This is because SMASheD does not consume much energy compared to other apps that need to continuously monitor the sensors (such as activity trackers), and it can utilize other benign apps to send the collected information to a remote attacker. Moreover, SMASheD can change the

phone settings, e.g., decrease screen brightness, mute sound and erase logs/traces to make the attacks “user-invisible”, as we will explain in Section IV-C.

- **Mutli-Device Applicability:** SMASheD is not limited to Android phones, but rather it works on any Android device. We tested reading and injecting sensor events on Android phones (Samsung S4, Samsung S5 and Motorola Droid X2), smartwatch (Samsung Gear Live) and Google Glass.

IV. ATTACKS USING SMASHED

In this section, we present various attacks that can be performed based on the sensor data reading-writing capability provided by SMASheD. The entire spectrum of attacks that SMASheD can enable, especially those involving touch injection, is possibly very broad. As such, our exposition is not exhaustive. However, we introduce some of the most interesting and potentially devastating attacks targeting both real-world applications and research systems.

A. Overview of Attacks and Attack Presentation

To present our attacks, we follow an *empirical-analytical* methodology. That is, we show the implementation and evaluation of several of our attacks, and present the rest of the attacks in an analytical way. The attacks that have been implemented and empirically studied (7 in number) are:

- **Touch-Logger:** (1) Key-logger that can be utilized to extract banking apps usernames/passwords, and (2) a general logger that can record user's touchscreen interactions.
- **Touch Injection:** (3) App installation bypassing permissions, (4) Permission escalation (making unauthorized phone call), (5) Phone unlock, and (6) Phone unlock bypassing biometrics security, e.g., [11], by replaying user's unlock-pattern.
- **Sensor Manipulation:** (7) Defeating a gesture-centric mobile malware defense [30].

The other proposed analytical attacks can be implemented similarly. We believe that it is not necessary to implement all attacks and our empirical-analytical exposition is sufficient to fully demonstrate the impact of the exposed vulnerability.

B. Sniffing Touchscreen Input (Touchlogger)

We will demonstrate how SMASheD can be used as a TouchLogger in order to sniff a user's sensitive information. According to Android security model, an app cannot read touch events performed by the user on other apps [13]. However, we will show how it is possible to infer the keys that the user has pressed, and therefore extract sensitive information efficiently and with 100% accuracy. We note that SMASheD is not only able to detect user key presses but it can also log any interaction of the user with the touchscreen, such as swiping, and zooming.

Many researchers have proposed mechanisms to infer the keys pressed by the users. These attacks require the user to install a malicious app on her phone. These methods range from utilizing motion sensors [2], [4], [37] and a combination

²http://developer.android.com/tools/help/monkeyrunner_concepts.html

of camera and microphone [33] to taking screenshot while the user is typing sensitive information, such as PINs or passwords [20]. However, these attacks usually have a relatively low accuracy and may be significantly affected by the way the user types and/or holds the phone. Taking pictures or recording audio may also trigger suspicion.

The *SMASheD* app can send *read* request to the *SMASheD* server to obtain all the events the user performs on the touchscreen. However, getting only the raw touch events is not enough to hamper the user privacy. Moreover, the attacker will be interested only in a small subset of these events. For example, an attacker will be interested in learning the password of the user on banking apps but not the input corresponding to user's interaction with a game.

According to the information the attacker wants to learn about the user, the attacker can modify the service in the *SMASheD* app so it sends *read* request when the app corresponding to the data the attacker wants to collect is launched. Moreover, if the attacker wants only to learn the keys the user presses while the app is running, he can send the *read* request when both the app and the keyboard are on the foreground.

To evaluate the ability of *SMASheD* to extract the username and password from various banking apps, we repurposed the original *SMASheD* app. When the *SMASheD* app is launched, it gets the list of installed apps on the device using *getPackageManager* API. Note that no permission is required to get the list of installed apps. Then, the *SMASheD* app looks for the apps that are already installed and are of interest to the attacker. The *SMASheD* app also finds the soft keyboards installed. The *SMASheD* app starts running its status detection service in the background, which regularly executes *ps* command to find out the list of running applications. Once any of the apps that the attacker wants to collect user data from appears in the output of the execution *ps* command, the service gets that app process ID, PID_{app} . The service also gets the process ID of the keyboard, PID_{kb} from the execution of the *ps* command. The service then executes *ps -tPID_{app}* command, which returns the list of threads of that process; whenever an app is on the foreground, the list of threads of that app has a thread named "GL updater".

If the app is running the "GL updater" thread, the service also checks if the keyboard is running "GL updater" thread. If both the app and the keyboard app have "GL updater" thread running, *SMASheD* detects that both of them are in the foreground and sends *read* request to the *SMASheD* server. When user exits the app or the keyboard (which can be detected by checking if the app is no longer in the list returned by executing the *ps* command, or if "GL updater" is not in the list of the thread running for either the app or the keyboard), the *SMASheD* app sends *stop* request to the *SMASheD* server. As a response to the *stop* request, the *SMASheD* server sends all the touch events to the *SMASheD* app. The *SMASheD* app parses the events and extracts the events with event type *ABS_MT_POSITION_X* and *ABS_MT_POSITION_Y* between *BTN_TOUCH DOWN* and *BTN_TOUCH UP* (Listing 1 in Appendix), if between the down and up events, the *ABS_MT_POSITION_X* or *ABS_MT_POSITION_Y* is missing, the value of it is same as its correspondent in the

previous touch. Finally, it maps the x and y coordinates to keys (keyboard layout can be detected by determining which soft keyboard the user is using, the orientation of the device and the screen resolution) and sends the text typed (if the user is using a soft keyboard that is unknown to *SMASheD*, *SMASheD* can send the name of the soft keyboard app, the x, y coordinates of each touch and the screen resolution and orientation to the attacker and the mapping can be performed offline), for example, to the attacker's web service via HTML request, or via other methods as we will discuss in Section IV-C.3.

We tested the above attack on some banking applications, such as Wells Fargo and Bank of America apps, and we could learn the username and password with 100% accuracy. The attack was tested on Samsung Galaxy S5 with Android OS version 5.0 and Samsung Galaxy S1 with Android OS version 4.4.2, and can be easily adapted to other Android phone models and even other devices such as smartwatches. Our attack is an extremely powerful attack since all the input provided by the user can be precisely and stealthily stolen, raising significant concerns for users' security and privacy.

C. Manipulating Touchscreen Sensor

The ability of injecting touch events could be extremely dangerous. In essence, it will allow the malware to do whatever the user can do with her device. The primary challenge for the attacker is to be stealthy. To do so, the attacker should inject the touch events while the user might not be attending to the phone, such as when the user is asleep or the phone is left inside a pocket or a purse. Such contextual scenarios can be determined by monitoring various motion and environmental sensors on the phone, as shown by prior research [22]. For example, the attacker can monitor the proximity and light sensors to infer when the phone is inside a pocket or placed in dark [38]. Moreover, *SMASheD* can change the phone settings, e.g., decrease screen brightness, mute sound and erase logs/traces to make the attacks "user-invisible."

Following subsections layout some of the attacks that *SMASheD* can perform given its capability to inject touch events.

1) *Installing Apps Bypassing Permissions*: *SMASheD* can install apps (benign or malicious) with extended permissions, available from Google Play Store, or any other website by injecting touch events on the infected device. To do so, *SMASheD* first sends an intent either to open the URL of the website where the malicious app resides, or to Google Play Store's app page. As the interface of the Google Play Store app is standard, *SMASheD* can inject touch events on the install button and then the accept button to grant the app with the requested permission. The position of the touch events can be calculated based on the screen dimensions. *SMASheD* can then close the Play Store app and clean-up any installation-related notifications. Similarly, *SMASheD* can open the malware-hosting website, download the APK, install the malware by clicking on the downloaded APK, grant the malware the desired permissions, and clean-up the traces. This way *SMASheD* can bypass Android's app security, which requires the user to grant permissions to different Android apps.

The installed malware apps can then do whatever they are designed to do against the phone or the user. We have developed and tested such an auto app installer. A demo is available at <https://androidsmashed.wordpress.com/demos/>.

2) *Permission Escalation*: *SMASheD* can utilize already installed apps to compromise user's privacy. For example, *SMASheD* can open the camera app and collect images of the user's surroundings to learn sensitive information about the user, similar to PlaceRaider [35], but without asking the user to grant the CAMERA permission to the *SMASheD* app. Similarly, *SMASheD* can open an audio recording app and monitor the ambient audio. Also, *SMASheD* can open any installed app having the GPS permission, acquire the location of the user, and take a screenshot of the app displaying the location by pressing and holding down the Power and the home button. This can be performed by writing press event to both of the buttons' files, waiting for 1 second and then writing release event to both of the buttons' files. *SMASheD* then can either send the snapshot to the attacker or perform simple image processing to extract the user location, given that *SMASheD* knows the app's layout and the screen dimensions.

Other possible attacks include: making phone call to premium rate numbers by opening the phone dialer and pressing the calling button, sending SMSs via a messaging app, sending the contact list of the user by opening the contact app, and sharing all the contacts via email or SMS with the attacker, changing the phone settings (such as toggling WiFi, GPS, etc) through the Settings app, muting the phone, and so on.

3) *Data Exfiltration*: Whenever *SMASheD* needs to send any data to a remote attacker (e.g., previously sniffed passwords, credit card numbers or pictures), it can stealthily transmit this data utilizing other apps, such as email or SMS. As some malware detection mechanisms detect malicious apps based on abnormal data usage, *SMASheD* can remain surreptitious and undetected by such systems. Moreover, *SMASheD* can delete the logs from the email and SMS apps so that users cannot trace back. This simple strategy will prevent *SMASheD* from being detected by either the device user or the anti-virus apps. Such an exfiltration will also avoid the need for doing any data processing on the infected device itself but rather allow the attacker to outsource all processing to a remote machine.

4) *Phone Unlock*: In order to allow *SMASheD* to access any of the device resources that require the device to be unlocked, *SMASheD* needs to unlock the device first. To do that, *SMASheD* first utilizes the TouchLogger presented in Section IV-B to log the user's PIN or pattern unlock while the user unlocks his phone. Then, whenever *SMASheD* wants to unlock the phone, it will simply inject the recorded PIN or pattern unlock onto the touchscreen. We have built and tested such an auto unlocker. A demo is available at <https://androidsmashed.wordpress.com/demos/>.

5) *Accessing User Accounts*: *SMASheD* can be used to open different apps that require authentication, and log into user's accounts. To do so, *SMASheD* will first extract the user's credentials for the target account by using the TouchLogger described in Section IV-B. *SMASheD* will then utilize this credential to log into the user account from her device.

Accessing the user accounts from the *SMASheD* infected device is important for several reasons. Many web services and banks implement a second factor authentication approach which may only allow the user to login from a registered device. Similarly, many banks require the user to answer security questions when she logs in from a different device, and others send notification to the user specifying the devices that are used to access her account. After having logged into the user accounts, *SMASheD* can, for example, access the account and perform any kind of the allowed banking transactions, read user's emails, send fake emails, forward the emails to a remote attacker, or read user's private data from or post messages on social media sites — the possibilities are endless.

6) *Attacking Biometric Authentication*: Recently, a significant amount of research has been done to authenticate a user transparently using biometrics. The touch-based biometrics are applied either as a second factor authentication mechanism during the device unlock or as a continuous authentication mechanism when the user is performing some activity on the device. Among these, some systems analyze the keystrokes of the users to capture the biometrics while others analyze touch gestures provided by the users. We now analyze a variety of these biometrics systems proposed in the literature and provide a systematic methodology to attack them using *SMASheD*.

a) *Keystroke biometrics*: Campisi *et al.* [5] present an approach to authenticate users based on their typing habits on the smartphones. Their approach relies on the analysis of keystroke dynamics. The system acquires and processes the time stamps generated by the mobile phones related to key press and release. Using these, the system further calculates different features such as Manhattan distance, Euclidean distance and statistical features and generate a template for each user. During the authentication, the system computes the normalized distance and compares that with a threshold.

To authenticate against such system, *SMASheD* needs to learn how the user types. During the learning phase, *SMASheD* can record the user's keystroke behavior and compute the features in a similar way to the authentication system. After learning, it can create the keystrokes such that the time interval *SMASheD* presses and releases the keys closely correlates with that of the user. Note that *SMASheD* can simply record and replay the user's keystroke without computing the features and the system may still fail to detect such malicious input. However, creating new keystrokes after learning the features is more detrimental to the user as the attacker can recreate any events or activities he likes.

b) *Touch gesture biometrics*: Frank *et al.* [13] present "Touchalytics", a continuous touch-based authentication system which utilizes the strokes performed by the user while using her phone. Touchalytics focuses on single touch gestures such as sliding horizontally and vertically. Sliding horizontally is common when navigating between the screens or images, while sliding vertical is common when reading email or documents. To authenticate using touch, Touchalytics records the touch coordinates, finger pressures, the screen areas covered by each finger, and times. Touchalytics extracts 30 different features from these raw inputs. Touchalytics uses these features

to build a profile of the user and utilizes it later to identify the user.

Since Touchalytics is monitoring and matching the touch with the trained data for horizontal and vertical slides only but not with other actions, *SMASheD* can perform tap/click and pinch without getting detected. However, to navigate up/down or right/left where *SMASheD* has to provide such horizontal/vertical slides, *SMASheD* needs to record the previous authentic slides from the user, and later inject them as desired. While outsider attacks using robots [28] have previously been reported against Touchalytics, the *SMASheD* attack represents the first known insider attack to our knowledge.

Li et al. [19] present an unobservable re-authentication system for smartphones using finger movement patterns. This system uses machine learning approach to authenticate the user based on touch input. The system monitors user's raw touch event data and preprocesses it, which assembles every single raw data into different gestures and then sends these to the feature extraction component. The predictor component consists of an SVM classifier and multiple classification modules. The system uses five different types of gestures: sliding up, sliding down, sliding left, sliding right and tap. For the sliding gesture, the system considers the properties such as first touch position, first touch pressure, first touch area, first moving direction, moving distance, duration, average moving direction, average moving curvature, average curvature distance, average pressure, average touch area, max-area portion and min-pressure portion, while for the tap gesture, it considers average touch area, duration and average pressure.

Attacking this system with *SMASheD* is simple as it is only looking for five different gestures as described above. *SMASheD* needs to learn how a user moves his finger for these gestures recording all the finger movements. Similar to attacking Touchalytics, *SMASheD* then repeats the recorded authentic slides and tap gestures from the user whenever it wants to perform certain activity on the phone.

Shahzad et al. [29] present "GEAT" for screen unlocking based on simple gestures. Along with the user touch input, GEAT uses other features such as finger velocity, device acceleration, stroke time, inter-stroke time, stroke displacement magnitude, stroke displacement direction, and velocity direction. GEAT segments each stroke into sub-strokes of different time duration where, for each sub-stroke, the user has consistent and distinguishing behavior. GEAT utilizes these features to train and later identify the user.

Since GEAT is only authenticating when user wants to unlock the screen, *SMASheD* can record all the raw touch and device acceleration data during the legitimate authentication by the user. It can later just replay the touch providing the recorded data such that the features would fully match.

Luca et al. [11] present another transparent authentication approach that enhances password patterns with an additional security layer. They study the touch stroke gestures corresponding to the horizontal slide and the pattern unlock. Their approach uses dynamic time warping for the analysis of touch

gestures using different features including XY-coordinates, pressure, size, time, and speed of the touch.

SMASheD cannot only thwart the password pattern to unlock the device but also foil the additional security layer provided by this system. As discussed in the Section IV-B, *SMASheD* first simply sniffs the password pattern. In addition, *SMASheD* records the pressure, size, time and speed of the touch when the legitimate user performs the pattern unlock gesture. Now, when the *SMASheD* app needs to unlock the device, it simply injects the previously recorded touch events to circumvent the authentication functionality. As our demo for phone unlock records the user interactions with her device while unlocking the device, and then replays it, it would also defeat this mechanism.

7) *Attacking Touch-Based Authorization: Roesner et al.* [25] propose the *user-driven access control* system where permission is granted using user actions rather than using manifests or system prompts. It introduces *access control gadgets* (ACGs). Each user-owned resource exposes UI elements, ACGs, which are embedded by the apps. The user's UI interaction with the ACG grants the app permission to access the corresponding resources. The system assumes that the kernel has complete control of the display and the apps cannot draw outside the screen space designated for them. Furthermore, it assumes that the kernel dispatches UI events only to the app with which the user is interacting.

The threat model of the system tries to restrict access such that only one app gets the permission from the user interaction, while other apps do not. It does not assume that the touch can be injected. No app will have permission to use the resource until the user explicitly interacts with the ACGs embedded by the app. To attack this system, *SMASheD* can provide the touch input to any app. For example, if *SMASheD* wants to make a phone call, it needs to interact with and provide touch to the phone calling ACG of the app. Since the system receives the touch, it will permit the app to make the phone call. In summary, *SMASheD* can fully bypass this system by injecting simple touch events.

Chaugule et al. [6] present a defense against unauthorized malicious behavior by utilizing the keypad or touchscreen interrupts. The system differentiates between malware and human activity by analyzing the presence of touch input which generates a hardware interrupt. Their approach especially focuses on preventing unauthorized messaging. The system assumes that the operating system is within the Trusted Computing Base and the hardware is not compromised. It assumes that the kernel memory interfaces are not exported to userspace so that userspace applications are not allowed to write into kernel memory and alter kernel control flow. They claim that there is no direct way in which the touchscreen interrupt handler will be called from userspace code unless the operating system is tampered with.

SMASheD can break this claim by providing the touchscreen interrupt without tampering with the operating system. *SMASheD* can provide touch screen input while sending the text message. When the touch event is injected, it will provide the necessary hardware interrupt that the system is

looking for and hence any app will be authorized to send the messages.

D. Manipulating Other Sensors

In this section, we first describe the systems which provide different security or non-security functionality based on the motion, position and environmental sensors. Then, we provide an attack scheme against each system using the sensor event injection capability of *SMASheD*.

Attacking these systems may not be straightforward. The best scenario to manipulate the sensor readings when the current sensor readings are not being altered by the natural events. For example, when the phone is in a pocket, the light sensor may not change. Since the sensor file will not be altered by the natural environment in this case, the malware can manipulate the sensor data as it likes. Also if the system is implementing a statistical approach (such as based on mean, standard deviation, etc., of the sensor data), the malware may not need to manipulate the sensors for the whole duration when the system is monitoring the sensors. *SMASheD* can insert some values that significantly changes these statistical features which causes the system to misjudge the sensing context. For the other systems, which implement specialized algorithms based on continuous sensor data, *SMASheD* needs to inject sensor readings at different timestamps that correlate to the sensor values during benign case.

1) *Attacking Authentication Systems*: Conti *et al.* [9] propose a system that transparently authenticates the user by analyzing her hand movement gesture while she is making or answering a phone call. It uses accelerometer and orientation sensor to detect the proposed gesture. The system uses the dynamic time warping distance (DTW-D) algorithm to verify if the authorized user is making or answering the phone call.

To attack this system, *SMASheD* can record the accelerometer and orientation sensor data when the user is making or receiving a valid call. Later, when *SMASheD* wants to make a call (e.g., to premium rate numbers or to user's contacts), it can replay the previously recorded sensor data, thereby fooling the system to believe that the user is making the call.

Gascon *et al.* [14] present an approach to continuously authenticate users on smartphones by analyzing their typing motion behavior. Along with touch input, it also records the timestamps when the keys are pressed or released. The system uses different motion and position sensors such as accelerometer, gyroscope and orientation sensors to capture behavioral biometrics so as to authenticate the user. It extracts various features leading to a 2376-dimensional vector representing the typing motion behavior of a user in a given time frame. The system is trained with the linear SVM classifier.

To attack this system, *SMASheD* needs to learn how the user presses each character, and reproduce it. During the learning phase, *SMASheD* continuously records the raw sensor data until it gets necessary information used by the system for all the keys during the legitimate key presses. Once the learning phase is completed, *SMASheD* can provide the touch injects with proper timings and the corresponding sensor readings. Since the motion and position sensors are continuously recording the data from the hardware, *SMASheD* may

need to wait for a favorable time, e.g., when the phone is static, otherwise the natural readings may interfere with the injected sensor readings possibly leading to rejection by the system.

2) *Attacking Authorization Systems*: We now consider various systems that provide the authorization functionality to access mobile device resources/services. The main purpose of these systems is to differentiate a human user from a bot so as to authorize access to the requesting app. To authorize human-vs-bot actions, these systems capture different explicit and implicit user's gestures measured using multiple sensors. Shrestha *et al.* [30] present "Tap-Wave-Rub". They propose multiple gestures that can be used for the purpose of authorization. An implicit gesture, such as tapping the phone with another device (*tap*), is used to provide NFC permission to the requesting app. The system uses accelerometer sensor to detect the *tap* gesture. An explicit gesture, such as waving a hand in front of the phone (*wave*) or rubbing a finger near the proximity sensor (*rub*), is used to grant permissions for the services where no implicit gesture can be used. To detect *wave* and *rub* gestures, the system uses proximity sensor. Shrestha *et al.* [32] also present "WaveToAccess", in which another mechanism for *wave* gesture detection is proposed. It utilizes the light sensors to infer the fluctuation in light due to hand waving and the accelerometer sensor to reduce the possibility of detecting other events as hand wave. Both Tap-Wave-Rub and WaveToAccess assume that the kernel is immune and the sensor data cannot be manipulated by the malware.

SMASheD attacks the assumption made by these systems. To generate the *tap*, *wave* or *rub* gesture, the attacker can record his own gesture and later inject the recorded values via *SMASheD*. Alternatively, *SMASheD* can record the gesture provided by the user during the benign case and replay it later. A simpler attack can be performed on *wave* and *rub* gestures in Tap-Wave-Rub, in which *SMASheD* fluctuates the proximity sensor in quick succession so that the system infers the corresponding gesture.

To test the validity of our attack, as a proof of concept, we implemented the algorithm used to detect Tap-Wave-Rub's *wave* and *rub* gestures following the instructions in [30]. The system detects the *wave* and *rub* gestures, when the proximity sensor changes for certain number of times (6 times) within certain period (1.5 seconds). In our attack, we recorded the valid *wave* and *rub* gestures and replayed them. *SMASheD* was able to deceive the system successfully. A demo is available at <https://androidsmashed.wordpress.com/demos/>.

Shrestha *et al.* [31] later present a similar defense to mobile malware using *transparent human gestures*. The system uses the hand movement gesture to prevent unauthorized access of the services such as phone calling, picture snapping and NFC tapping. It looks for multiple, motion, position and environmental sensor data to detect the calling, snapping and tapping gestures. The assumption that the system makes is the device is already infected with malware. However, the device kernel is healthy and is immune to the malware infection, and the malware is not capable of manipulating the sensors.

SMASheD can attack the assumptions of these systems. The attacker can record the sensor data that is being used by these systems to detect the gesture during call, snap or tap. Now, when malware is trying to make a call, snap photo or tap NFC tag, *SMASheD* can replay all these sensor data fooling the system to believe that the user is performing the activity.

3) *Attacking Video Authenticity*: Rahman *et al.* [24] develop “Movee”, a system to authenticate the ownership of the video content based on accelerometer. When the original video is recorded, the motion of the device as reported by the accelerometer should correspond to the inferred motion from the captured video. Movee verifies such “liveness” of the video streams by checking the correlation between the data from the accelerometer sensor and the data from the camera.

SMASheD can attack this system in two different ways. First, it can alter the sensor data of the original videographer’s device such that the system falsely accuses him of plagiarism. Second, it can manipulate the accelerometer data such that plagiarising videographer is falsely credited as the owner of the video. The former can be achieved by randomly injecting noise to the accelerometer readings such that the data from the accelerometer sensor and the data from the camera do not corroborate. In contrast, to do the latter, the attacker must use *SMASheD* in combination with video motion analyzer that provides the required accelerometer changes corresponding to the video. While the attacker is recording the video from another device, *SMASheD* will inject the reading provided by video motion analyzer into the attacker’s device. Note that the attacker will try to minimize the accelerometer changes from the natural movements by keeping the device stationary.

4) *Subverting Safety Applications*: Smartphones sensors have been used by myriad of apps to provide functionalities other than security, such as context modeling and activity recognition. Although these apps are not directly related to security, these apps still provide functionality for the safety and well-being of the users. *SMASheD* can subvert many of these systems based on Android sensors.

Falls are a major health hazard for elderly people degrading their quality of life, or even resulting in death, if assistance is not provided on time. Dai *et al.* [10] present “PerFallD” utilizing mobile phones as the platform for a fall detection system for elderly people. Fang *et al.* [12] also present a fall detection system. Both of these systems utilize accelerometer and orientation sensors to detect the fall events. While Bai *et al.* [3] use 3-axis accelerometer sensor only in smartphone to design and implement a fall monitor system.

SMASheD can manipulate sensor data to trigger false alarms by injecting sensor readings that correspond to a fall. If *SMASheD* has previously detected the sensor readings for which the fall detection alarm was triggered, then it can simply replay those readings and defeat the above systems.

You *et al.* [39] present the “CarSafe” app. This work utilizes both rear and front cameras on the smartphones to provide driver safety. The frames from the front camera are used to identify if the driver is not paying attention to the road, or is drowsy, whereas the frames from the rear camera are used

to identify the dangerous driving events such as tailgating, or drifting by analyzing the front vehicle following distance and the lane trajectory. Since currently only one camera can be accessed at a time on smartphones and there is a cost of switching the camera, the system has a blind spot and can potentially miss some dangerous events. To overcome the blind spot, it uses motion sensors in conjunction with the GPS data to get the hints about the blind spot. For example, if the motion sensor data infers turning or lane change while road trajectory from GPS indicates no turn, it might imply a dangerous event such as a lane change. This hint is used to activate the rear camera to analyze if the lane change event has occurred.

To attack this system, *SMASheD* can falsely alter the motion sensor data such that the system alarms the user even when he is alert, annoying the user and possibly leading the user to disable the app. Alternatively, *SMASheD* can manipulate the motion sensors such that the readings corresponds to the trajectory followed by the vehicle, as reported by the GPS, and the system fails to predict unintentional lane change, compromising the safety of the driver. The *SMASheD* app can access the GPS location by using another app that has GPS permissions (as suggested in Section IV-C.2).

V. SMASHED MITIGATION

To protect against the adversarial applications of *SMASheD*, we suggest the following potential mitigation strategies. Although these strategies may not fully prevent the attacks, they may help reduce the impact of the underlying vulnerability.

First, we believe that it is important to raise people’s awareness of the possible security risks associated with installing services through the ADB shell. Second, we suggest following the permission models of Android for native services that are executed through the ADB shell. In the current model, any native service that starts through the ADB shell is granted all the permissions that the shell has without notifying the user. These permissions include accessing logs, frame buffer, motion, position, environmental, and user input sensors. An attacker may not reveal all the resources that the service is accessing. For example, the attacker could publish a service as a snapshot service while injecting code that accesses sensor files as well. This may be prevented if the service is only granted permissions after informing the user. Third, we suggest enforcing security policies for the communication between processes running on the device through sockets. We recommend that Android monitors the open sockets on the device and the apps that are accessing those sockets. Whenever an unusual communication is detected, Android should at least inform the user. Whether or not users would pay attention to such notifications is an independent concern. However, we believe that the potential risks should be conveyed to the users.

VI. RELATED WORK

Our paper is not the first to study the vulnerability underlying the ADB workaround. Recently, Lin *et al.* [20] developed Screenmilk, a malicious app that can glean sensitive information from the mobile device’s screen (specifically passwords

TABLE I

COMPARISON BETWEEN *SMASheD*, SCREENMILKER AND BITTERSWEET ADB. *SMASheD* THREAT MODEL IS REALISTIC, AND ITS ATTACK PRACTICALITY LEVEL IS HIGH, VERY SIMILAR TO THAT OF SCREENMILKER, AND *SMASheD* ATTACK IMPACT, ACCURACY AND STEALTHINESS IS HIGHER THAN THAT OF SCREENMILKER. BITTERSWEET ADB THREAT MODEL IS MUCH STRONGER, AND ITS PRACTICALITY IS MUCH LOWER COMPARED TO BOTH SCREENMILKER AND *SMASheD*

	Threat Model	Practicality	Attacks Enabled	Attack Stealthiness	Attack Accuracy
Screenmilker [20]	User installs a screenshot service which exposes its functionality to all apps on the same device with INTERNET permission	High (highlighted by the high number of current installations of screenshot apps)	Keystroke logging, password extraction and contact info collection	Sends the extracted info to the malware owner via http requests, which can be detectable	Keystroke logging accuracy is about 30-80%. Password extraction requires around 2.5 rounds to succeed. Contact info collection is accurate.
Bittersweet ADB [17]	<ul style="list-style-type: none"> User enables USB debugging and forgets to disable it, <i>OR</i> user's device is infected by a malware that turns on USB debugging, <i>AND</i> User connects her device to a PC that is infected with a malware that installs an ADB service on the device 	Low (requires a pair of infected PC and device, and/or a neglectful user who accepts "USB debugging is being turned on" notification)	Private data leakage, usage monitoring and behavior interference	The attacks can be detected utilizing code static analyzer [17]	Can be accurate (evaluations were not reported in [17])
SMASheD	<ul style="list-style-type: none"> User installs an ADB service that provides sniff/inject functionality and exposes this functionality to all apps on the same device with INTERNET permission, <i>OR</i> User installs any ADB service that provides any benign ADB functionality and adds sniff/inject functionality without informing the user 	High (as highlighted in Section III-E)	All the attacks enabled by Screenmilker and Bittersweet ADB. Various other devastating attacks based on injecting touch and physical sensors events	Consumes few resources, utilizes various channels to send the extracted data to the malware owner, and wipes out all attack traces with touch injects (Section IV-C3)	Highly accurate

of banking apps) by communicating with a snapshot service installed through ADB. Screenmilker exploits the vulnerability of snapshot services of exposing their ADB capabilities to any app with INTERNET permission installed on the same device.

Also, Hwang et al. [17] presented "Bittersweet ADB", a set of conceptual attacks using ADB ranging from private data leakage to usage monitoring and behavior interference. The threat model in [17] assumes that the user has enabled USB debugging on her phone and forgot to disable it and later her PC got infected with a malware such as the one explained in [21] which installs an ADB service on the connected device. Then, whenever the user connects her device to her infected PC, the malware on the PC installs a malicious service with ADB capabilities on the user phone. The authors also developed an app that can enable USB debugging without user knowledge. Although Android 4.2.2 and higher display a dialog asking the user to allow debugging via PC when the device is connected to a PC, the authors assume that the users would just accept. The authors proposed the use of static analyzer to detect the proposed attacks. The static analyzer checks if the private information resulted from executing ADB command is sent outside the Android device via socket API.

In our paper, we extensively expanded the scope and the impact of the ADB vulnerability to much more devastating, stealthy and accurate attacks than the one proposed in [20] and with a weaker (more realistic) threat model than [17]. We comprehensively and systematically exposed the vulnerability of sniffing and manipulating many protected Android sensors, and translated it into a wide spectrum of

catastrophic attacks against real-world and research systems. Our proposed framework is the first, to our knowledge, that sniffs and manipulates protected sensors on unrooted Android devices, without user awareness, without constant device-PC USB connection (unlike the monkeyrunner tool) and without the need for an infected PC (unlike [17]). Table I provides a summary of comparison between *SMASheD*, Screenmilker [20] and Bittersweet ADB [17].

VII. CONCLUSION AND FUTURE WORK

In this paper, we called the Android's sensor security model into question. We exploited Android's ADB workaround to develop a framework that can effectively sniff and manipulate many sensors currently protected by Android's access control model. Our framework can be used to: (1) directly sniff the touchscreen sensor data, (2) directly manipulate the touchscreen, motion, position and environmental sensor data, and (3) indirectly, using the touch inject capability, sniff the audio-visual and navigational sensors. Based on this framework, we introduced a wide spectrum of potentially devastating attacks that can compromise user privacy and subvert many security and non-security applications that rely upon different sensors. Since the scope of our attacks is extremely broad, we provided demonstrations for a selection of schemes and presented an analytical exposition of several other schemes.

We believe that our framework can facilitate many other applications beyond the ones we presented, which we also plan to explore in our future work.

APPENDIX

[69934.435503]	EV_ABS	ABS_MT_TRACKING_ID	0000038d
[69934.435533]	EV_KEY	BTN_TOUCH	DOWN
[69934.435564]	EV_ABS	ABS_MT_POSITION_X	000003b2
[69934.435564]	EV_ABS	ABS_MT_POSITION_Y	00000607
[69934.435595]	EV_ABS	ABS_MT_TOUCH_MAJOR	00000012
[69934.435595]	EV_ABS	ABS_MT_TOUCH_MINOR	00000009
[69934.435625]	EV_ABS	ABS_MT_WIDTH_MAJOR	00000002
[69934.435625]	EV_ABS	003c	ffffffa6
[69934.435778]	EV_SYN	SYN_REPORT	00000000
[69934.452105]	EV_ABS	ABS_MT_TOUCH_MAJOR	00000024
[69934.452105]	EV_ABS	ABS_MT_TO UCH_MINOR	0000001b
[69934.452135]	EV_ABS	ABS_MT_WIDTH_MAJOR	00000008
[69934.452135]	EV_ABS	003c	fffffffd
[69934.452166]	EV_SYN	SYN_REPORT	00000000
[69934.462847]	EV_ABS	003c	00000000
[69934.462877]	EV_SYN	SYN_REPORT	00000000
[69934.494371]	EV_ABS	ABS_MT_TRACKING_ID	ffffffff
[69934.494402]	EV_KEY	BTN_TOUCH	UP
[69934.494402]	EV_SYN	SYN_REPORT	00000000

Listing 1. Sample output from running *getevent* for a single press release.

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