AppPAL for Android Capturing and Checking App Installation Policies

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Users must judge apps based only on the information presented to them by the store. Employers rely on employees using company devices appropriately to enforce security policies at work. Some users spend time to pick apps with care others don't. This may cause frustration when they realise what data the apps have access to. We present AppPAL: a policy language that can enforce app installation policies. Policies use statements from third parties and delegation relationships. This gives us a rigorous and flexible framework for enforcing and comparing and app policies; and the trust relationships surrounding them.

1 Introduction

Finding good apps can be tricky. Users need to work out which apps are well written. They also need to find the apps which suit how they want to use their phone. This can be difficult. It isn't obvious how apps use the data each has access to.

App stores give some information about their apps; such as permissions and review scores. Android apps show a confusing list of permissions (Figure 1). Users don't all understand how permissions relate to their device [12, 30]. Ultimately the decision which apps to use must be made by a human.

Not all apps are suitable. A large amount of potentially unwanted software (PUS) is being propagated for Android devices [31, 29]. Employees are increasingly using their own phones for work (the bring your own device (BYOD) scheme.) A employers may wish to restrict which apps their employees can use. The chief information security officer (CISO) or IT department may set a policy to prevent information leaks. Some users worry apps will misuse their personal data; such a user avoids apps which can access their location, or address book. They apply their own personal security policy when downloading apps.

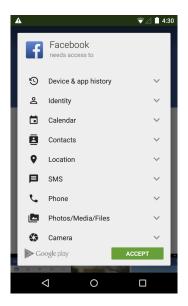


Figure 1: Security information presented when a user downloads the Facebook app.

These policies are enforced by hand, if at all. This is error-prone and mistakes can be made. We believe this can be bettered. An alternative would be to write the policy down and make the computer do it. To implement this we can use a logic of authorization. The policy may be written in the logic and enforced automatically.

We present AppPAL, an authorization logic for reasoning about Android apps. The language is an instantiation of SecPAL [5] tailored to making statements about apps. The language allows us to reason about apps using statements from third parties. The implementation allows us to enforce the policies on a device. We can express trust relationships amongst these parties; use constraints to perform additional checks. This lets us enforce deeper and more complex policies than existing tools such as Kirin [8].

Using AppPAL we can make statements about apps:

"Alice" says "com.rovio.angrybirds" isInstallable.

We can delegate decisions to others:

- "Alice" says "Bob" can-say 0 App isCool.
- . We can run analysis tools, and solve constraints:
- "Claire" says App isMalware
 if App isAnApp
 where
 virusScanner(App) = True.

Specifically we:

• Described a scenario where a user has a policy they want to enforce for their employees (Section 2.) We show how the trust relationships in a system can be difficult to see; and how AppPAL makes the trust between users explicit.

- Shown how the user's policy could be implemented using AppPAL (Section 3); and describe what AppPAL would check for an app to meet this policy.
- Implemented the AppPAL language. Our implementation runs on Android (Section 4.) We show how we have tailored the language to Android (Subsection 4.1), how we evaluate it (Subsection 4.2), and some idiomatic policies (Subsection 4.3.)
- When things go wrong we also need to attribute blame. Authorization logic can help make trust relationships explicit. In Subsection 4.1 we show a recent example of a broken trust relationship, and how our authorization logic makes the problem explicit.

2 Enforcing a policy at work

Suppose *Alice* works for her *em*ployer *Emma*. Emma allows Alice to use her personal phone as a work phone, but she has some specific concerns.

- Alice shouldn't have any apps that can track her movements. The testing labs are at a secret location and it mustn't be leaked.
- Apps should come from a reputable source, such as the Google Play Store.
- Emma uses an anti-virus (AV) program by McAfee. It should check all apps before they're installed.

To ensure this policy is fully met Alice could promise to follow it. Perhaps she might even sign a document promising to do so. This is error-prone—what if she makes a mistake or misses something? Emma's policy could be implemented using existing tools. The enterprise tool *Google's Device Policy for Android*¹ could configure Alice's device to disallow apps from outside the Google Play Store. Various tools such as AppGuard [2], Dr. Android & Mr. Hide [22] or AppFence [20] can control the permissions or data an app can get. These could be used to used to ensure no location data is ever obtained. Alternately other tools like Kirin [8], Flowdroid [14] or DroidSafe [16] could check that the locations are ever leaked to the web. Various anti-virus programs are available for Android—one could be installed on Alice's phone checking against McAfee's signatures.

Whilst we *could* implement Emma's policy using existing tools, it isn't a great solution. It isn't flexible, Alice needs to alter and remove the software on her phone if Emma changes her policy or she changes jobs. It isn't clear what an app must do to be installed, or what checks have been done if it already has been put on the phone. The link between Alice, the user; Emma, the policy setter; and the tools Emma trusts to implement her policy isn't immediately apparent.

Our research looks at the problem of picking software. Given there are some apps you want and others you don't: how can you express your preferences in such a way

https://play.google.com/store/apps/details?id=com.google.android.apps.enterprise.
dmagent

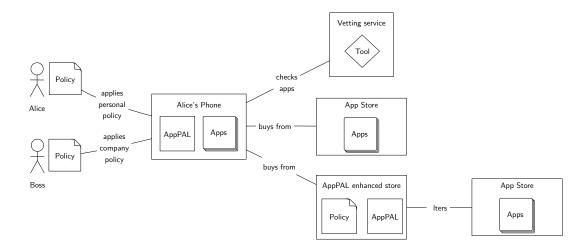


Figure 2: Ecosystem of devices and stores with AppPAL.

that they can be enforced automatically? How can we translate policy documents from natural language into something machine checkable? Furthermore how can we show the trust relationships used to make these decisions clearly and precisely?

3 Expressing Policies in AppPAL

Returning to Alice and Emma's dilemma in Section 2, we propose a solution. Instead of using several different tools to enforce Emma's policy disjointedly, we use an authorization logic. In Figure 4 we give an AppPAL policy implementing Emma's app concerns on Alice's phone. A pictorial representation, is given in Figure 3; color is used to split statements by each speaker.

AppPAL is an instantiation of SecPAL [5] for app installation policies. SecPAL is a logic of authorization for access control decisions in distributed systems. It has a clear and readable syntax, as well as rich mechanisms for delegation and constraints. SecPAL has already been used as a basis for other policy languages in areas such as privacy preferences [6] and data-sharing [1]. We present AppPAL as a new version of SecPAL, targeting apps on mobile devices.

In line 1 Alice gives Emma the ability to specify whether an App (a variable) isInstallable (a predicate). She allows her to delegate the decision further if she chooses (can-sayinf). Next in line 2 Emma specifies her concerns as policies to be met (the isMetBy() predicate that takes an app as its argument). If Emma can be convinced all these policies are met then he will say the App isInstallable. In line 6 and line 8 Emma specifies that an app meets the reputable-source-policy if the App isReputable; with "google-play" specified as the decider of what is buyable or not. This time Google is not allowed to delegate the decision further (can-say0). In other words Google is not allowed to specify Amazon as a supplier of apps as well. Google must say what is buyable directly for Emma to accept it. Emma specifies the "anti-virus-policy" in

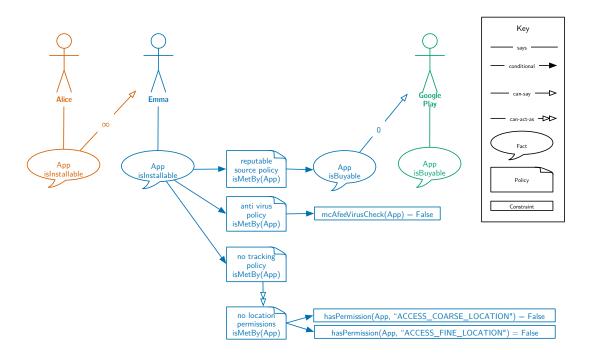


Figure 3: Pictorial representation of Alice's app install policy.

```
"alice " says "emma" can-say inf App isInstallable.
   "emma" says App isInstallable
    if "no-tracking-policy" isMetBy(App),
       "reputable —source—policy" isMetBy(App),
       "anti-virus-policy" isMetBy(App).
   "emma" says "reputable—source—policy" isMetBy(App)
    if App isReputable.
   "emma" says "google-play" can-say 0 App isReputable.
   "emma" says "anti-virus-policy" isMetBy(App)
    if App isAnApp
    where
11
      mcAfeeVirusCheck(App) = False.
   "emma" says "no-location-permissions" can-act-as "no-tracking-policy".
   "emma" says "no-location-permissions" isMetBy(App)
14
    if App isAnApp
15
    where
      hasPermission(App, "ACCESS_FINE_LOCATION") = False,
      hasPermission(App, "ACCESS_COURSE_LOCATION") = False.
```

Figure 4: AppPAL policy implementing Emma's security requirements

line 9. Here we use a constraint. When checking the policy the mcAfeeVirusCheck should be run on the App. Only if this returns False will the policy be met. To specify the "no-tracking-policy" Emma says that the "no-location-permissions" rules implement the "no-tracking-policy" (line 13). Emma specifies this in line 14 by checking the app is missing two permissions.

Say Alice wants to install a new app (com.facebook.katana) on her phone. To meet Emma's policy the AppPAL policy checker needs to collect statements to show the app meets the isInstallable predicate. Specifically it needs:

- "emma" says "com.facebook.katana" isAnApp. A simple typing statement that can be generated for all apps as they are encountered.
- "google-play" says "com.facebook.katana" isReputable. Required to convince Emma the app came from a reputable source. It should be able to obtain this statement from the Play store as the app is available there.
- "emma"says "anti-virus-policy" isMetBy("com.facebook.katana"). She can obtain this by running the AV program on her app.
- "emma" says "no-locations-permissions" is MetBy ("com.facebook.katana"). Needed to show the App meets Emma's no-tracking-policy. Emma will say this if after examining the app the location permissions are missing.

These last two statements require the checker to do some extra checks to satisfy the constraints. To get the third statement it must run the AV program on her app and check the result. The results from the AV program may change with time as it's signatures are updated. Consequently the checker must re-run this check every time it wants to obtain the statement connected to the constraint. For the forth statement the checker needs to check the permissions of the app. It does this by looking in the MANIFEST.xml inside the app itself.

In this scenario we have imagined Alice wanting to check the apps as she installs them. Alternatively we could imagine Emma wanting a personalised app store where all apps sold meet her policy. With AppPAL this can be implemented by taking an existing store and selectively offering only the apps which meet the policy.

4 The details

AppPAL is implemented as a library for Android. A standalone Java version also exists for testing. The parser is implemented using ANTLR4. Code, tests, and prebuilt APKs are available from Github².

4.1 The Language

The structure of an AppPAL assertion is shown in Figure 5.

²https://github.com/bogwonch/AppPAL

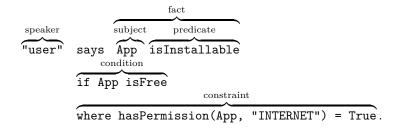


Figure 5: Structure of an AppPAL assertion.

In the Becker et al.'s paper [5] they leave the choice of predicates, and constraints for their SecPAL open. With AppPAL we make explicit our predicates and how they relate to Android. Some of these predicates require arguments. We add a light typing system to help ensure these predicates have the correct arguments.

Specifically we define the following predicates:

App isInstallable Used to indicate that an App meets the install policy for the device. Showing an app satisfies this predicate is usually the goal of evaluating AppPAL.

App is Anapp, Policy is Applicy... Simple typing relations. The app App is an App, and so on.

Policy isMetBy(App) Policies let you split app behaviour into sub-policies. For example in Section 3 we showed how Emma's installation policy could be written using three isMetBy statements. Splitting policies allows greater control of how each one is checked. We can delegate checking a policy to an expert using the can-say statement. We can specify more detailed checks using the can-act-as statements.

Policy shownIsMetBy(Evidence, App) A variant of the isMetBy statement that allows some evidence (a proof) to be given that shows the policy is met.

Splitting the decision as to whether an app is installable into a series of policies that must be met gives us flexibility in how the decision is made. It allows us to describe multiple means of making the same decision, and provide backup routes when one means fails. Some static analysis tools are not quick to run. Even taking minutes to run an expensive (in terms of battery power) analysis can be undesirable. If a user wants to download an app quickly they may not be willing to wait to check that a policy is met.

Consider the *no-tracking-policy* from earlier. In Bob's policy we checked this by checking the permissions of the app. If the app couldn't get access to the GPS sensors (using the permissions) then it met this policy. Some apps may want to access this data, but may not leak it. We could use a taint analysis tool to detect this (e.g. Taintdroid [14]). Our policy now becomes:

"bob" says "no-locations-permissions" can-act-as "no-tracking-policy".
"bob" says "no-locations-permissions" isMetBy(App)

```
if App isAnApp
where
  hasPermission(App, "ACCESS_FINE_LOCATION") = False,
  hasPermission(App, "ACCESS_COARSE_LOCATION") = False.

"bob" says "location—taint—analysis" can—act—as "no—tracking—policy".
"bob" says "location—taint—analysis" isMetBy(App)
  if App isAnApp
  where
  taintDroidCheckLeak(App, "Location", "Internet") = False.
```

Sometimes we might want to use location data. For instance Bob might want to check that Alice is at her office. Bob might use a location tracking app to do this. Provided the app only talks to Bob, and it uses SSL correctly (something Mallodroid can check for [10]) he is happy to relax the policy.

```
"bob" says "relaxed-no-tracking-policy" canActAs "no-tracking-policy".
"bob" says "relaxed-no-tracking-policy" isMetBy(App)
  if App hasCategory("tracking")
  where
    mallodroidSSLCheck(App) = False,
    connections(App) = "[https://bob.com]".
```

This gives us four different ways of satisfying the *no-tracking-policy*: with permissions, with taint analysis, with a relaxed version of the policy, or by Bob directly saying the app meets it. When we come to check the policy if any of these ways give us a positive result we can can stop our search.

AppPAL also helps attribute blame when things go wrong. By modelling the trust relationships in systems we can work out precisely where mistakes were made. A recent example demonstrating this is CVE-2015-2077. Lenovo was found to be shipping laptops with the *Superfish* malware pre-installed. Lenovo had also installed an AV package on their laptops; this AV did recognise Superfish as malware. Unfortunately they had configured it to ignore Superfish. The malware was an ad framework designed to show users products similar to those they viewed on the web. Unfortunately it did so by man-in-the-middling all SSL traffic using a shared private key.

From a user's perspective there was a delegation of trust to Lenovo to detect malware. Lenovo then delegated further to McAfee to supply the antivirus checking; but left an exception that they would allow Superfish. A user might wonder where the breach of trust occurred and who is to blame? Is it the AV failing to spot the malware? Has someone else configured something incorrectly? How should they fix the problem?

If we write this in the AppPAL policy language the cause of the breach of trust becomes apparent; as does the fix.

```
"user" says "lenovo" can-say inf File isSafe.
"lenovo" says "mcafee" can-say inf File isSafe.
"lenovo" says "C:\System\superfish" isSafe.
```

```
\frac{AC,D \models \texttt{A} \text{ says B can-act-as C}}{AC,D \models \texttt{A} \text{ says C verbphrase}} \xrightarrow[\text{can-act-as }]{} CAC,D \models \texttt{A} \text{ says B verbphrase}} \xrightarrow[\text{can-say }]{} CAC,D \models \texttt{B} \text{ says fact}} \xrightarrow[\text{can-say }]{} CAC,\infty \models \texttt{A} \text{ says fact}} \xrightarrow[\text{can-say }]{} CAC,D \models
```

Figure 6: AppPAL's evaluation rules.

The fault lies with line 3. Lenovo has caused the problem (they *said* it was safe). The fix is to revoke this statement, or to revoke line 1 and find a different AV supplier.

4.2 Evaluation

To evaluate AppPAL we implement the SecPAL evaluation rules shown in Figure 6. We do not use the DatalogC [24] based translation and evaluation algorithm suggested by Becker et al.. Rather we implement the rules directly in Java. Brief pseudo-code is given in Figure 7 Like Becker et al. we make use of an assertion context to store known statements. We also store intermediate results to avoid re-computation. On a mobile device memory is at a premium. We would like to keep the context as small as possible. To do this we allow some assertions to be imported at evaluation-time.

This gives us greater control of the evaluation and how the assertion context is created. For example, when checking the <code>isAnApp</code> predicate; we can fetch the assertion that the subject is an app based on the app in question. Similarly when we use a statement from <code>Emma</code> that <code>Google-Play can-say</code> whether an app is purchasable; it is sensible to go fetch from the store whether the app is saleable and make <code>Google say</code> it then and there.

In SecPAL there is no notion of type. All entities are either constants (effectively strings) or variables. There is no differentiation made between a *voiced* constant (one who speaks), and a *subject* (one that is the subject of a verb-phrase, or predicate argument). In AppPAL the subjects are usually apps or policies. Apps do not utter facts. Consequently there is no need to check them as potential speakers of *can-say* statements. Similarly if a constant never appears as a subject of a statement, as most speakers don't, there is no need to check it as a possible subject for a *can-act-as* statement. We preprocess the assertion context to find *voiced* and *subject* constants.

4.3 Policy Examples

In this section we give examples of policies and queries and show how they can be implemented in AppPAL.

App white-listing by an IT department Inside Emma's company employees in the IT department may white-list certain apps as installable. To do this Emma delegates to them to decide if something is installable.

```
# ac, d |-? q (using previous-results table rt)
def evaluate(ac, rt, q, d)
                                                 # Try cond rule
 return rt[q, d] if rt.contains q, d
                                                 def cond(ac, rt, q, d)
 p = cond(ac, rt, q, d)
                                                  ac.add q.fetch if q.isFetchable
 return (Proven, rt.update q, d, p) if p.isValid ac.assertions.each do |a|
 p = canSay_CanActAs(ac, rt, q, d)
                                                   if (u = q.unify a.consequent) &&
 return (Proven, rt.update q, d, p) if p.isValid
                                                       (a = u.substitution a).variables == none
 return (Failure, rt.update q, d, Failure)
                                                      return checkConditions ac, rt, a, d
                                                   return Failure
# Try can-say and can-act-as
def canSay_CanActAs(ac, rt, q, d)
                                                 # Evaluate the antecedents
 ac.constants.each do |c|
                                                 def checkConditions(ac, rt, a, d)
   if c.is_a :subject
                                                   getVarSubstitutions(a, ac.constants).each do |s|
     p = canActAs ac, rt, q, d
                                                     sa = s.substitute a
     return Proven if p.isValid
                                                    if sa.antecedents.all
   elsif c.is_a :speaker
                                                        { |a| evaluate(ac, rt, a, d).isValid }
     p = canSay ac, rt, q d
                                                       p = evaluateC sa.constraint
     return Proven if p.isValid
                                                       return Proven if p.isValid
 return Failure
                                                   return Failure
```

Figure 7: Partial-pseudocode for AppPAL evaluation.

```
"emma" says "it-department" can-say 0 App isInstallable.
```

Charlie and Diveena work in the IT department. When they have checked an app they say it is installable.

```
"emma" says "charlie" can-act-as "it-department".
"emma" says "diveena" can-act-as "it-department".
" charlie " says "com.facebook.katana" isInstallable.
" diveena" says "org.thoughtcrime.securesms" isInstallable.
```

Overpriviliged applications Alice is particularly worried about apps stealing her data. She knows that certain apps need certain permissions. For example a photography app needs access to the camera. She checks each app's permissions carefully for things that seem unusual.

Alice's policy can be implemented by checking the permissions of the app, using constraints.

```
" alice " says App isInstallable
  if " permissionsPolicy " isMetBy(App).
" alice " says " permissionsPolicy " isMetBy(App)
  if App isAnApp
  where
     category(App, "Photography"),
     hasPermission(App, "ACCESS_COARSE_LOCATION") = False,
     hasPermission(App, "CAMERA") = True.
```

Discovering the *normal* permissions for an app can be done by mining large stores of apps, or apps a user has previously installed. Alternately tools like Stowaway [11] could be integrated to check apps.

Digital Evidence In Subsection 4.1 we described how digital evidence could be used to decide if policies are met. Suppose a digital evidence generating tool, such as *Evicheck*, can be used to check a policy. For example that no audio can be recorded without the users consent [28]. Using this tool someone generates a proof certificate that this property is met. This could be the developer of the app, a third party certification service, or someone else; when we check the proof we will find out if it is valid or not.

```
" alice " says Anyone can-say 0
    "recording -consent" shownIsMetBy(Evidence, App).

"skb" says "recording -consent"
    shownIsMetBy("evicheck://evidence123", App).

" alice " says "recording -consent" isMetBy(App)
    if "recording -consent" shownIsMetBy(Evidence, App)
    where
        evicheckCheckEvidence(Evidence, App) = True.
```

In the example here Alice allows anyone to present her with evidence for her policy. A security knowledge base (SKB) offers an some evidence, and Alice accepts it as if it checks out.

5 Related work

There has been a great amount of work on developing app analysis tools for Android. Tools such as Stowaway [11] detect overprivileged apps. TaintDroid [9] and Flow-Droid [14] can do taint and control flow analysis; sometimes even between app components. Other tools like QUIRE [7] can find privilege escalation attacks between entire apps. ScanDAL [23] and SCanDroid [15] help detect privacy leaks. Appscopy [13] searches for specific kinds of malware. Tools like DroidRanger [32] scan app markets for malicious apps. Many others exist checking and certifying other aspects of app behaviour.

One tool, Kirin [8], also created a policy language and tool for enforcing app installation policies. Kirin's policies were concerned with preventing malware. Policy authors could specify combinations of permissions that should not appear together. For example an author might wish to stop malware sending premium rate text messages. To do this they restrict an app having both the SEND_SMS and WRITE_SMS permissions (Figure 8). Using this approach they found vulnerabilities in Android, but were ultimately limited by being restricted to permissions and broadcast events.

restrict permission [SEND_SMS] and permission [WRITE_SMS]

```
"user" says "no-write-send-sms" isMetBy(App)
where hasPermission(App, "SEND_SMS") = False.
"user" says "no-write-send-sms" isMetBy(App)
where hasPermission(App, "WRITE_SMS") = False.
```

Figure 8: Kirin and AppPAL policies for stopping apps monetized by premium rate text messages.

Whilst this approach is great for malware, it is less suitable for finding PUS. The behaviours and permissions PUS apps display aren't necessarily malicious. One user may consider apps which need in-app-purchases to play malware, but another may enjoy them. AppPAL tries to stop these PUS apps. Because we can use external checking tools which go further than permissions checks, our policies can be richer. By allowing delegation relationships we can understand the provenance and trust relationships in these rules.

Work by Lin et al. looked at modelling users' willingness to grant different kinds of permissions [26]. They found four clusters of different users each with different kinds of policies: conservatives who don't like granting many permissions, advanced users who seem to have more complex policies, unconcerned users who'll comfortably grant anything, and fence-sitters (about half of all users) who seemed not to really care the majority of the time. This suggests that users are applying policies and do care how apps behave. Further more Lin et al. speculate that the fence-sitters seemed not to care because of warning fatigue. This suggests a system like AppPAL that can reduce user interaction with permission warnings might be interesting. Using a policy unconcerned and fence-sitting users could take up more privacy preserving policies without having to change their behavior.

We picked SecPAL as the basis for AppPAL because it was readable, extensible, and seemed to be a good fit for the problem we were trying to solve [19]. Further more attempts to apply it to other areas had already succeeded [1, 21]. Other policy languages such as RT [25], or Cassandra [4] might also have made a good starting point. However neither had the precise set of features we we're looking for (namely explicit speakers and external checking functions). Other work on SecPAL has added various features such as existential quantification [3] and ultimately becoming the DKAL family of policy languages [17, 18]. Gurevich and Neeman showed that SecPAL was a subset of DKAL (minus the *can-act-as* statement). DKAL also contains more modalities than *says*.

6 Conclusions and further work

We have presented AppPAL: an authorization logic for describing app installation policies. The language is implemented in Java and runs on Android using a custom evalu-

ation algorithm. This allows us to enforce app installation policies on Android devices. We've shown how the language can be used to describe an app installation policy; and given brief descriptions of how other policies might be described.

Further work is required to tightly integrate AppPAL into Android. The obvious place to put it would be as a required checker: a program that checks all apps before installation. Google currently use this API to check for known malware and jailbreak apps. We would like AppPAL to sit there and check apps on the basis of policies. Unfortunately the API is protected and it would require the phone to be rooted to run there.

Developing, and testing, policies for users is a key next step. Here we described a policy being specified by a company boss. For most end-users writing a policy in a formal language is too much work. Ad-blocking software works by users subscribing to filter policies written by experts³. We can imagine a similar scheme working well for app installation policies. Users subscribe to different policies by experts (e.g. no tracking apps, nothing with adult content, no spammy in-app-purchase apps). Optionally they can customize them further.

We should also attempt to learn policies from existing users behavior. Given app usage data, from a project like Carat [27], we could identify security conscious users. If we can infer these users policies we may be able to describe new policies that the less technical users may want. Given a set of apps one user has already installed, we could learn policies about what their personal installation policy is. This may help stores show users apps they're more likely to buy, and users apps that already behave as they want.

AppPAL is a powerful language for describing app installation policies. It gives us a framework for describing and evaluating policies for Android apps. The work provides new ways for users to enforce their own rules about how apps should behave. Users policies can be enforced more reliably, and with less interaction; thus making apps more pleasant and safer for everyone.

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³EasyList is a popular choice and the default in most ad-blocking software. They offer many different policies for specific use-cases however. https://easylist.adblockplus.org/en/

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