Most Websites Don't Need to Vibrate: A Cost-Benefit Approach to Improving Browser Security

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ABSTRACT

Modern web browsers have accrued an incredibly broad set of features since being invented for hypermedia dissemination in 1990. Many of these features benefit users by enabling new types of web applications. However, some features also bring risk to users' privacy and security, whether through implementation error, unexpected composition, or unintended use. Currently there is no general methodology for weighing these costs and benefits. Restricting access to only the features which are necessary for delivering desired functionality on a given website would allow users to enforce the principle of lease privilege on use of the myriad APIs present in the modern web browser.

However, security benefits gained by increasing restrictions must be balanced against the risk of breaking existing websites. This work addresses this problem with a methodology for weighing the costs and benefits of giving websites default access to each browser feature. We model the benefit as the number of websites that require the feature for some user-visible benefit, and the cost as the number of CVEs, lines of code, and academic attacks related to the functionality. We then apply this methodology to 74 Web API standards implemented in modern browsers. Wefi nd that allowing websites default access to large parts of the Web API poses significant security and privacy risks, with little corresponding benefit.

We also introduce a configurable browser extension that allows users to selectively restrict access to low-benefit, high-risk features on a per site basis. We evaluated our extension with two hardened browser configurations, and found that blocking 15 of the 74 standards avoids 52.0% of code paths related to previous CVEs, and 50.0% of implementation code identified by our metric, without affecting the functionality of 94.7% of measured websites.

CCS CONCEPTS

• Security and privacy → Browser security; Vulnerability management; Software security engineering;

KEYWORDS

Browser security, Software security, Web security and privacy

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1 INTRODUCTION

Since its beginnings as a hypermedia dissemination platform, the web has evolved extensively and impressively, becoming part communication medium and part software distribution platform. More recently, the move from browser plugins to native HTML5 capabilities, along with efforts like Chrome OS and the now defunct Firefox OS, have expanded the Web API tremendously. Modern browsers have, for example, gained the ability to detect changes in ambient light levels [58], perform complex audio synthesis [14], enforce digital rights management systems [25], cause vibrations in enabled devices [36], and create peer to peer networks [11].

While the web has picked up new capabilities, the security model underlying the Web API has remained largely unchanged. All websites have access to nearly all browser capabilities. Unintended information leaks caused by these capabilities have been leveraged by attackers in several ways: for instance, WebGL and Canvas allowed Cao et al. to construct resilient cross-browserfi ngerprints [21], and Gras et al. were able to defeat ASLR in the browser [30] using the Web Workers and High Resolution Timing APIs. One purported benefit of deploying applications via JavaScript in the browser is that the runtime is sandboxed, so that websites can execute any code it likes, even if the user had never visited that site before. The above attacks, and many more, have subverted that assumption to great effect.

These attacks notwithstanding, allowing websites to quickly provide new experiences is a killer feature that enables rapid delivery of innovative new applications. Even though some sites take advantage of these capabilities to deliver novel applications, a large portion of the web still provides its primary value through rich media content dissemination. We show in this work that most websites can deliver their beneficial functionality to users with only a limited number of JavaScript APIs. Additionally, when websites need access to less common functionality, we demonstrate a mechanism to enablefi ne-grained access to JavaScript features on a case-by-case basis.

An understanding of the benefits and risks of each JavaScript feature is necessary to make sound decisions about which features need to be enabled by default to create the modern web experience. With this knowledge, a set of highly beneficial features can be exposed by default to all websites, while only trusted sites that need additional features are given the ability to access the full set of capabilities in the browser, thus enforcing the principle of least privilege on the Web API.

This work applies a systematic cost-benefit analysis to the portions of the Web API implemented in all popular browsers. We

 $^{^1}$ We present a more extensive overview of academic attacks and the JavaScript APIs that enable them in Section 5.2.1, and further enumerate the attack to enabling feature mapping in Table 4 in the Appendix.

present a method to quantitatively evaluate both the **cost** of a feature (the added security risk of making a feature available) and the **benefit** of a feature (the number of websites that require the feature to function properly). We then build a browser extension which blocks selected JavaScript functions to generate the results discussed in this paper. In this work we specifically consider the open web accessed via a desktop browser, but the same approach could be expanded to any website viewed via any browser.

Using these cost-benefit measurements, we create two hardened browser configurations by identifying high-cost standards that could be blocked in the browser without affecting the browsing experience on most websites. We present a browser extension that enforces these hardened browser configurations, and compare the usability of these hardened browser configurations against other popular browser-security tools, NoScript and the Tor Browser Bundle (TBB). Wefi nd that our hardened browser configurations offer substantial security benefits for users, while breaking fewer websites than either NoScript or the default configuration of the TBB during our evaluation on both the 200 most popular sites in the Alexa 10k, and a random sampling of the rest of the Alexa 10k.

Our browser-hardening extension is highly configurable, allowing functionality to be blocked or allowed on a per-site basis. The set of standards blocked can be updated to reflect changes in the popularity or security costs of each standard.

This work presents the following technical contributions:

- ES6 Proxy based featurefi rewall. (Section 3) We leverage the ES6 proxy object to build a featurefi rewall which dynamically disables JavaScript API features without breaking most code that expects those features to exist.
- Code complexity as cost. (Section 4.5.2) We perform a static analysis of the Firefox codebase to identify and count lines of code exclusively used to enable each web standard. Wefi nd a moderate, statistically significant relationship between this code complexity metric and previously discovered vulnerabilities attributed to these standards.
- Contextual protection extension. (Section 7) We package the featurefi rewall in an open source browser extension that allows the deployment of pre-defined conservative and aggressive feature blocking policies. The extension is highly customizable, with a user experience similar to popular ad blocking software, including blocked API notifications, streamlined reload and retry, and customizable site whitelisting.

Further, these tools enable an analysis of the Firefox source code with the intention of determining the costs and benefits of each Web API standard, yielding the following additional contributions.

Understanding feature benefit (Section 5.1). We define the benefit of enabling a feature as the number of websites which require the feature to function correctly, as perceived by the user in a casual browsing scenario. We show that two humans using simple rules to independently gauge the functionality of a website under different levels of browser functionality can have high agreement (97%), and thus can be used to model the benefit of a given feature. We use this methodology to investigate the necessity of 74 different

features in 1,684 different paired tests undertaken across 500 hours of human effort.

Understanding feature cost. (Section 5.2) We define the cost of enabling a feature as the number of vulnerabilities in the newly exposed attack surface. Because this value is unknowable, we model cost in three ways:fi rst, we model security cost as a function of the number of previously reported CVEs in a feature, on the intuition that features which are difficult to code correctly are more likely to have further undiscovered vulnerabilities.

Second, we model security cost as the number of attacks introduced in academic papers which have been enabled by each Web API standard.

Third, we model security cost as a function of code complexity. We attribute entry points in the browser's C++ codebase to JavaScript exposed features, and then quantify complexity as the number of lines of code used solely to implement access to each feature.

2 RELATED WORK

In this section we discuss the current state of browser features, as well as existing user level security defenses.

2.1 Browser Feature Inclusion

Browsers compete on performance, security, and compatibility. This final point introduces two security related challenges:fi rst, vendors are very wary of removing features from the browser, even if they are used by a very small fraction of all websites [5, 8]. Second, because the web is evolving and even competing with native applications (especially on mobile devices), browser vendors are incentivized to continue to add new features to the web browser and not remove old features. Browsers using the same code base across all devices, including mobile, browser OS devices (e.g., Google Chromebooks), and traditional PCs also increases the amount of code in the browser. The addition of support for this variety of devices means that JavaScript features that support hardware features (webeams, rotation sensors, vibration motors, or ambient light sensors, etc. [36, 37, 39, 58]) are included in the browser for all devices, regardless of whether they include such hardware. All of this has resulted in a massive growth of the amount of code in the browser, with Firefox currently containing over 13 million lines of code, and Chrome containing over 14 million [18].

2.2 Client Side Browser Defenses

There are variety of techniques which "harden" the browser against attacks via limiting what JavaScript is allowed to run within the browser. These defenses can be split into two categories: those configured by the user, and those configured by the website author. Our method is in the former category, allowing the user to make decisions about which features to enable when.

In the user configured category, both Adblock and NoScript prevent JavaScript from running based on the site serving it. While its primary function is to block ads for aesthetic purposes, Adblock [1] can also prevent infection by malware being served in those ads [19, 51]. Adblock blocks JavaScript features by preventing the loading of resources from certain domains, rather than disabling specific functionality. NoScript [42] prevents JavaScript

on an all-or-nothing basis, decided based on its origin. Its default for unknown origins is to allow nothing, rendering a large swath of the web unusable. It is worth noting that NoScript defaults to whitelisting a number of websites, which has resulted in a proof of concept exploit via purchasing expired whitelisted domains [20]. Beyond these popular tools, IceShield [33] dynamically detects suspicious JavaScript calls within the browser, and modifies the DOM to prevent attacks.

The Tor Browser [24] disables by default or prompts the user before using a number of features. Regarding JavaScript, they disable SharedWorkers [10], and prompt before using calls from HTML5 Canvas, the GamePad API, WebGL, the Battery API, and the Sensor API [52]. These particular features are disabled because they enable techniques which violate the Tor Browser's security and privacy goals.

On the website author side, Content Security Policy allows limiting of the functionality of a website, but rather than allowing browser users to decide what will be run, CSP allows web developers to constrain code on their own sites so that potential attack code cannot access functionality deemed unnecessary or dangerous [56]. Conscript is another client-side implementation which allows a hosting page to specify policies for any third-party scripts it includes [43]. There are also a number of technologies selected by the website author but enforced on the client side, including Google Caja [44] and GATEKEEPER [32].

There are existing models for enforcing policies to limit functionality outside of the web browser as well. Mobile applications use a richer permission model where permission to use certain features is asked of the user at either install or run-time [6, 17].

3 INTERCEPTING JAVASCRIPT FUNCTIONALITY

Core to both our measurements and the browser hardening extension is the ability to disable specific features from the browser's JavaScript environment. Here we present a technique for removing access to these features while minimizing collateral damage in code that expects those features to be available.

3.1 Web API / W3C standards

When visiting and displaying websites, browsers build a tree-based model of the document. This tree, along with the methods and properties the browser provides to allow site authors to interact with the browser and the tree, are collectively known as the DOM (document object model), or the Web API.

The browser makes much of its functionality available to websites through a single, global object, called window. Almost all JavaScript accessible browser functionality is implemented as a property or method on this global object. The set of properties, functions, and methods available in the DOM is standardized using Interface Description Language documents. Browser vendors implement these standards in their browsers.

For the purposes of this paper, we define a **feature** as an individual JavaScript method or property available in the browser, and a **Web API standard** (or just **standard**) as a collection of features collected into a single document and published together. Each

standard generally contains features that are intended to be used together to enable a common functionality (such as WebGL graphics manipulation, geolocation services, or cryptographic services).

3.2 Removing Features from the DOM

Each webpage and iframe gets its own global window object. Changes made to the global object are shared across all scripts on the same page, but not between pages. Furthermore, changes made to this global object are seen immediately by all other script running in the page. If one script deletes or overwrites the window.alert function, for example, no other scripts on the page will be able to use the alert function, and there is no way they can recover it.

As a result, code executed earlier can arbitrarily modify the browser environment seen by code executed later. Since code run by browser extensions can run before any scripts included by the page, extensions can modify the browser environment for all code executed in any page. The challenge in removing a feature from the browser environment is not to *just* prevent pages from reaching the feature, but to do so *in way that still allows the rest of the code on the page to execute without introducing errors.*

For example, to disable the getElementsByTagName feature, one could simply remove the getElementsByTagName method from the window. document object. However, this will result in fatal errors if future code attempts to call that now-removed method.

Consider the code in Figure 1: removing the window.document .getElementsByTagName method will cause an error on line one, as the site would be trying to call the now-missing property as if were a function. Replacing getElementsByTagName with a new, empty function would solve the problem on line one, but would cause an error on line two, unless the function returned an array of at least lengthfi ve. Even after accounting for that result, one would need to expect that the setAttribute method was defined on the fourth element in that array. One could further imagine that other code on the page may be predicated on other properties of that return value, and fail when those are not true.

```
1  var ps, p5;
2  ps = document.getElementsByTagName("p");
3  p5 = ps[4];
4  p5.setAttribute("style", "color: red");
5  alert("Success!");
```

Figure 1: Trivial JavaScript code example, changing the color of the text in a paragraph.

3.3 ES6 Proxy Configuration

Our technique solves this problem through a specially constructed version of the Proxy object. The Proxy object can intercept operations and optionally pass them along to another object. Relevant to this work, proxy objects also allow code to trap on general language-operations. Proxies can register generic handlers thatfi re when the proxy is called like a function, indexed into like an array, has its properties accessed like an object, and operated on in other ways.

We take advantage of the Proxy object's versatility in two ways. First, we use it to prevent websites from accessing certain browser features, without breaking existing code. This use case is described in detail in Subsection 3.4. And second, we use the Proxy object to enforce policies on runtime created objects. This use case is described in further detail in Subsection 3.5

3.4 Proxy-Based Approach

Wefi rst use the Proxy object to solve the problems described in 3.2. We create a specially configured a proxy object that registers callback functions for *all* possible JavaScript operations, and having those callback functions return a reference to the same proxy object. We also handle cases where Web API properties and functions return scalar values (instead of functions, arrays or higher order objects), by programming the proxy to evaluate to 0, empty string, or undefined, depending on the context. Thus configured, the proxy object can validly take on the semantics of any variable in any JavaScript program.

By replacing getElementsByTagName with our proxy, the code in Figure 1 will execute cleanly and the alert dialog on line four will successfully appear. On line one, the proxy object's function handler will execute, resulting in the proxy being stored in the ps variable. On line two, the proxy's get handler will execute, which also returns the proxy, resulting in the proxy again being stored in p5. Calling the setAttribute method causes the proxy object to be called twice,fi rst because of looking up the setAttribute, and then because of the result of that look up being called as a function. The end result is that the code executes correctly, but without accessing any browser functionality beyond the core JavaScript language.

The complete proxy-based approach to graceful degradation can be found in the source code of our browser extension 2 .

Most state changing features in the browser are implemented through methods which we block or record using the above described method. This approach does not work for the small number of features implemented through property sets. For example, assigning a string to document.location redirects the browser to the URL represented by the string. When the property is being set on a singleton object in the browser, as is the case with the document object, we interpose on property sets by assigning a new "set" function for the property on the singleton using Object.defineProperty.

3.5 Sets on Non-Singleton Objects

A different approach is needed for property sets on non-singleton objects. Property sets cannot be imposed on through altering an object's Prototype, and non-singleton objects can not be modified with Object. defineProperty at instrumentation time (since those objects do not yet exist). We instead interpose on methods that yield non-singleton objects.

We modify these methods to return Proxy objects that wrap these non-singleton objects, which we use to control access to set these properties at run time. For example, consider the below code example, using the *Web Audio* API.

In this example, we are not able to interpose on the gainNode. channelCount set, as the gainNode object does not exist when we modify the DOM. To address these cases, we further modify the AudioContext.property.createGain to return a specially created proxy object, instead of a GainNode object. This, specially

```
1  var context = new window.AudioContext();
2  var gainNode = context.createGain();
3  gainNode.channelCount = 1;
```

Figure 2: Example of setting a property on a non-singleton object in the Web API.

crafted proxy object wraps the GainNode object, allowing us to interpose on property sets. Depending on the current policy, we either ignore the property set or pass it along to the original GainNode object.

3.6 Security Implications

There are some code patterns where the proxy approach described here could have a negative impact on security, such as when security sensitive computations are done in the client, relying on functionality provided by the Web API, and where the results of those calculations are critical inputs to other security sensitive operations. We expect that such cases are rare, given common web application design practices. Even so, in the interest of safety, we whitelist the *WebCrypto* API by default, and discuss the security and privacy tradeoffs here.

As discussed above, our proxy-based approach for interposing on Web API features replaces references to the functionality being blocked with a new function that returns the proxy object. In most cases where the feature being replaced is security relevant, this should not negativly effect the security of the system. For example, if the encrypt method from the *Web Crypto* were replaced with our proxy object, the function would not return an unencrypted string, but instead the proxy object. While this would break a system that expected the cryptographic operation to be successful, it would "fail-closed"; sensitive information would **not** be returned where encrypted information was expected.

Conversely, if getRandomValues is used to generate a nonce, the returned proxy object would coerce to an empty string. While the security repercussions of this silent failure could possibly be grave, [54] observed that the vast majority of calls to getRandomValues on the open web could be considered privacy-invasive, as they were used as part of the Google Analytics tracking library. Even so, the potential harm to users from a silent failure is too great, resulting in our decision to whitelist <code>WebCrypto</code>. As our proposed contextual protection extension can implement arbitrary policies, we look forward to debate among experts and users as to what a sensible set of defaults should be in this situation.

4 METHODOLOGY

In this section we describe a general methodology for measuring the costs and benefits of enabling a Web API standard in the browser. We measure the benefit of each standard using the described feature degradation technique for each standard of features, browsing sites that use those feature, and observing the result. We measure the cost of enabling each standard in three ways: as a function of the prior research identifying security or privacy issues with the standard, the number and severity of associated historical CVEs, and the LoC needed to implement that standard.

 $^{^2 \}mathrm{URL}$ Redacted for review.

4.1 Representative Browser Selection

This section describes a general methodology for evaluating the costs and benefits of enabling Web API standards in web browsers, and then the application of that general approach to a specific browser, **Firefox 43.0.1**. We selected this browser to represent modern web browsers general for several reasons.

First, Firefox's implementation of Web API standards is representative of how Web API standards are implemented in other popular web browsers, such as Chrome. These browsers use WebIDL to define the supported Web API interfaces, and implement the underlying functionality mostly in C++, with some newer standards implemented in JavaScript. These browsers even share a significant amount of code, through their use of third party libraries and code explicitly copied from each other's projects (for example, very large portions of Mozilla's WebRTC implementation is taken or shared with the Chromium project in the form of the "webrtc" and "libjingle" libraries).

Second, the standardized nature of the Web API means that measures of Web API costs and benefits performed against one browser will roughly generalize to all modern browsers; features that are frequently used in one browser will be as popular when using any other recent browser. Similarly, most of the attacks documented in academic literature exploit functionality that is operating as specified in these cross-browser standards, making it further likely that this category of security issue will generalize to all browsers.

Third, we use Firefox, instead of other popular browsers, to build on other related research conducted on Firefox (e.x. [54] and [53]). Such research does not exist for other popular browsers, making Firefox a natural choice as a research focus.

For these reasons, we use Firefox 43.0.1 as representative of browsers in general in this work. However, this approach would work with any modern browser, and is in no way tied to Firefox 43.0.1 in particular.

4.2 Measuring by Standard

To measure the costs and benefits of Web API features in the browser, we identified a large, representative set browser features implemented across all modern web browsers. We extracted the 1,392 standardized Web API features implemented in Firefox, and categorized those features into 74 Web API standards, using the same technique as in [54].

Using the features listed in the W3C's (and related standards organizations) publications, we categorized Console.prototype.log and Console.prototype.timeline with the $Console\ API$, SVGFilterElement.apply and SVGNumberList.prototype.getItem with the SVG standard, and so forth, for each of the 1,392 features.

We use these 74 standards as our unit of Web API measurement for two reasons. First, focusing on 74 standards leads to less of a combinatorial explosion when testing different subsets of Web API functionality. Secondly, as standards are organized around high level features of the browser that often have one cohesive purpose, for instance the *Scalable Vector Graphics* standard or the *Web Audio API*, being able to reason about what features a website might need is useful for communicating with users who might be interested in blocking (or allowing) such features to run as part of a given website.

4.3 Determining When A Website Needs A Feature

Core to our benefit metric is determining whether a given website needs a browser feature to function. When a site does not need a feature, enabling the feature on the site provides little benefit to browser users.

Importantly, we focus our measurements on an unauthenticated casual browsing scenario. This approach will not capture features like rich user to user messaging or video chat. We believe this casual browsing scenario properly approximates the situation in which a heightened security posture is most needed: when a userfi rst visits a new site, and thus does not have any trust relationship with the site, and likely little or no understanding of the site's reputation for good security or privacy practices. Once a user has a better idea of how much to trust the site and what features the site requires, they may adaptively grant specific permissions to the site.

Determining whether a website actually needs a feature to function is difficult. On one end of the spectrum, when a website never uses a feature, the site trivially does not need to feature to run correctly. Previous work [54] shows that most features in the browser fall in this category, and are rarely used on the open web.

However, a website may use a feature, but not need it to carry out the site's core functionality. With the feature removed, the website will still function correctly and be fully usable. For example, a blog may wish to use the *Canvas* standard to invisiblyfingerprint the visitor. But if a visitor's browser does not support the *Canvas* standard, the visitor will still be able to interact with the blog as if the standard was enabled (though the invisiblefingerprinting attempt will fail).

This measure of feature "need" is intentionally focused on the *the perspective of the browser user*. The usefulness of a feature to a website author is not considered beyond the ability of the site author to deliver a user-experience to the browser user. If a site's functionality is altered (e.g. tracking code is broken, or the ability to A/B test is hampered) in a way the user cannot perceive, then we consider this feature as not being needed from the perspective of the browser user, and thus not needed for the site.

With this insight in mind, we developed a methodology for evaluating the functionality of a given website. We instructed two undergraduate workers to visit the same website, twice in a row. The first visit is used as a control, and was conducted in an unmodified Firefox browser. The worker was instructed to perform as many different actions on the page as possible within one minute. (This is in keeping with the average dwell time a user spends on a website, which is slightly under a minute [41].) On a news site this would mean skimming articles or watching videos, on e-commerce sites searching for products, adding them to the cart and beginning the checkout process, on sites advertising products reading or watching informational material and trying any live demos available, etc.

The second visit is used to measure the effect of a specific treatment on the browsing experience. The worker visits the same page a second time, with all of the features in a Web API standard disabled. For another minute, the worker attempts to perform the same actions they did during thefi rst visit. They then assign a score to the functionality of the site: 1 if there was no perceptible difference between the control and treatment conditions, 2 if the browsing

experience was altered, but the worker was still able to complete the same tasks as during thefi rst visit, or 3 if the worker was not able to complete the same tasks as during the control visit.

We then defined a site as broken if the user cannot accomplish their intended task (i.e., the visit was coded as a 3). This approach is inherently subjective. To account for this, we had both workers browse the same site independently, and record their score without knowledge of the other's experience. Our workers averaged a 96.74% agreement ratio. This high agreement supports the hypothesis that the workers were able to successfully gauge whether particular functionality was necessary to the goals of a user performing casual web browsing.

4.4 Determining Per-Standard Benefit

We determined the benefit of each of the 74 measured standards in four steps.

First, we select a set of websites to represent the internet as a whole. This work considers the top 10,000 most popular websites on the Alexa rankings as representative of the web in general, as of July 1, 2015, when this work began.

Second, for each standard, we randomly sampled 40 sites from the Alexa 10k that use the standard, as identified by [54]. Where there were less than 40 sites using the standard, we selected all such sites. That work found that while there is some difference in the Web API standards that popular and unpopular websites use, these differences are small [54]. We therefor treat these randomly sampled 40 as representative of all sites using the standard.

Third, we used the technique described in Section 3 to create multiple browser configurations, each with one standard disabled. This yielded 75 different browser configurations (one configuration with each standard disabled, and one "control" case with all standards enabled).

Fourth, we performed the manual testing described in Section 4.3. We carried out the above process twice for each of the 1679 sites tested for this purpose. By carrying out the above process for all 74 standards, we were able to measure the **site break rate** for each Web API standard, defined as the percentage of times we observed a site break during our paired tests with the featured disabled, multiplied by how frequently the standard is used in the Alexa 10k. We then define the benefit of a standard as a function of its site break rate; the more sites break when a standard is disabled, the more useful the standard is to a browser user. The results of this measurement are discussed in Section 5.

4.5 Determining Per-Standard Cost

We measure the security cost of enabling a Web API standard in three ways.

First, we measure the cost of enabling a Web API standard in a browser as a function of CVEs that have been reported against the standard's implementation in the browser in the past. We take past CVEs as an indicator of present risk for three reasons. First, areas of code that have multiple past CVEs suggest that there is something about the problem domain addressed by this code that is difficult to code securely, suggesting that these code areas deserve heightened scrutiny (and carry additional risk). Second, prior research [50, 64] suggest that bugsfi xes often introduce nearly as many bugs as they

address, suggesting that code that has been previously patched for CVEs carries heightened risk for future CVEs. Third, recent notable industry practices suggest that project maintainers sometimes believe that code that has had multiple security vulnerabilities should be treated greater caution (and that shedding the risky code is safer than continually patching it) [29].

Second, we measure the cost of including a Web API standard by the amount of related academic work documenting security and privacy issues in a standard. We searched for attacks leveraging each Web API standard in security conferences and journals over the lastfi ve years.

Third, we measure the cost of including a Web API standard by the number of lines of code needed solely to implement the standard in the browser, as code complexity (measured through number of lines of code in function definitions) has been shown to have moderate predictive power for discovering where vulnerabilities will happen within the Firefox codebase [53].

4.5.1 CVEs. We determined the number of CVEs previously associated with each Web API standard through the following steps: First, we searched the MITRE CVE database for all references to Firefox in CVEs issued in 2010 or later, resulting in 1,554 CVE records

We then reviewed each CVE and discarded 41 CVEs that were predominantly about other pieces of software, where the browser was only incidentally related (such as the Adobe Flash Player plugin [3], or vulnerabilities in web sites that are exploitable through Firefox [4]).

Next, we examined each of the remaining CVEs to determine if they documented vulnerabilities in the implementation of one of the 74 considered Web API standards, or in some other part of the browser, such as the layout engine, the JavaScript runtime, or networking libraries. We identified 175 CVEs describing vulnerabilities in Firefox's implementation of 39 standards. 13 CVEs documented vulnerabilities affecting multiple standards.

We identified which Web API standard a CVE related to by reading the text description of each CVE. We were able to attribute CVEs to individual standards in the following ways:

- 117 (66.9%) CVEs explicitly named a Web API standard.
- 32 (18.3%) CVEs named a JavaScript method, structure or interface) that we tied to a larger standard.
- 21 (12%) CVEs named a C++ class or method that we tie to the implementation of Web API standard, using the methodology described in 4.5.2.
- 5 (2.8%) CVEs named browser functionality defined by a Web API standard (e.x. several CVEs described vulnerabilities in Firefox's handling of drag-and-drop events, which are covered by the HTML standard [61]).

When associating CVEs with Web API standards, we were careful to distinguish between CVEs associated with DOM-level functionality and those associated with more core functionality. This was done to narrowly measure the cost of *only* the DOM implementation of the standard. For example, the SVG Web API standard [22] allows site authors to use JavaScript to dynamically manipulate SVG documents embedded in websites. We counted CVEs like

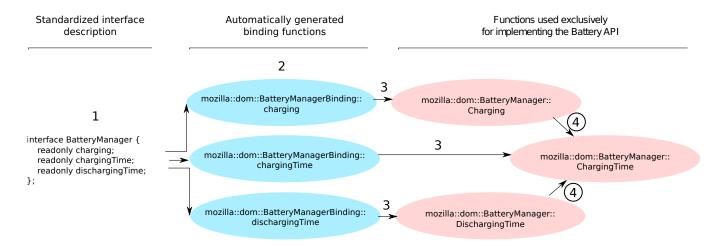


Figure 3: An example of applying the graph pruning algorithm to a simplified version of the Battery API.

CVE-2011-2363 [2], a "Use-after-free vulnerability" in Firefox's implementation of JavaScript DOM API for manipulating SVG documents, as part of the cost of including the SVG Web API standard in Firefox. We did not consider CVEs relating to other aspects of SVGs handing in our Web API standard costs. CVE-2015-0818 [7], a privilege escalation bug in Firefox's SVG handling, is an example of a CVE we did not associate with the SVG Web API standard, as it was not part of the DOM.

4.5.2 Implementation Complexity. We use the browser source to generate lower-bound approximations for how complex each standards' implementation, as significant lines of C/C++ code. We consider standards with more complex implementations as having a greater cost to the security of the browser than those with simpler implementations.

We consider only lines of C/C++ code used *only* to support JavaScript based access to that specific feature. We henceforth refer to this metric as Exclusive Lines of Code, or **ELoC**. We compute the ELoC for each Web API standard in three steps.

We generated a call graph of Firefox using Mozilla's DXR tool [45]. DXR uses a clang compiler plugin to produce an annotated version of the source code through a web app.³ We use this call graph to determine which functions call which other functions, where functions are referenced, etc. We further modified DXR to record the number of lines of code for each function.

Next, we determined each standards' unique entry points in the call graph. Each property, method or interface defined by a Web API standard has two categories of underlying code in Firefox code. There is **implementation code** (hand written code that implements Web API standard's functionality), and **binding code** (programmatically generated C++ code only called by the JavaScript runtime). Binding code is generated at build time from WebIDL documents, an interface description language that defines each Web API standard's JavaScript API endpoints. By mapping each feature in each Web IDL document to a Web API standard, we are able to associate each binding code function with a Web API standard.

Given the entry points in the call graph for each Web API feature, we used a recursive graph algorithm to identify implementation code associated with each standard. We illustrate an example of this approach in Figure 3. In step 1, we programmatically extract the standard's definitions for its binding functions, as we do here using a simplified version of the *Battery API*. In step 2, we locate these generated binding functions in the Firefox call graph (denoted by blue nodes). By following the call graph, we identify implementation functions that are called by the *Battery API's* binding functions, denoted by pink nodes. (step 3). If these pink nodes have no incoming edges other than binding functions, we know they are solely in the code base because of the Web API standard associated with those binding functions.

Thefi rst iteration of the algorithm identifies two functions, Charging and DischargingTime, as being solely related to the *Battery API* standard, since no other code within the Firefox codebase contains a reference or call to those functions. The second iteration of the pruning process identifies the ChargingTime function as also guaranteed to be solely related to the *Battery API* standard's implementation, since it is only called by functions we know to be solely part of the *Battery API*'s implementation. Thus, the lines implementing all three of these pink implementing functions are used to compute the ELoC metric for the *Battery API*.

4.5.3 Third Party Libraries. This technique gives a highly accurate, lower bound measurement of lines of code in the Firefox source included only to implement a single Web API standard. It does not include code from third-party libraries, which are compiled as a separate step in the Firefox build process, and thus excluded from DXR's call-graph.

To better understand their use, we investigated how third party libraries are used in the Firefox build process. In nearly all cases, the referenced third party libraries are used in multiples places in the Firefox codebase and cannot be uniquely attributed to any single standard, and thus are not relevant to our per-standard ELoC counts.

The sole exception is the *WebRTC* standard, which uniquely uses over 500k lines of third party code. While this undercount is large,

³An example of the DXR interface is available at https://dxr.mozilla.org/mozilla-central/source/.

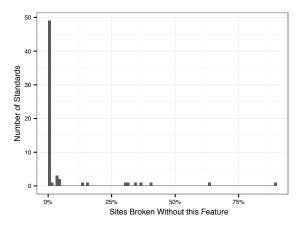


Figure 4: A histogram giving the number of standards binned by the percentage of sites that broke when removing the standard.

it is ultimately not significant to our goal of identifying high-cost, low-benefit standards, as the high number of vulnerabilities in the standard (as found in CVEs) and comparatively high ELoC metric alreadyfl ag the standard as being high-cost.

5 MEASURED COST AND BENEFIT

This section presents the results of applying the methodology discussed in Section 4 to Firefox 43.0.1. The sectionfi rst describes the benefit of each Web API standard, and follows with the cost measurements.

5.1 Per-Standard Benefit

As explained in Section 4.4, our workers conducted up to 40 measurements of websites in the Alexa 10k known to use each specific Web API standard. If a standard was observed being used fewer than 40 times within the Alexa 10k, all sites using that standard were measured. In total, we did two measurements of 1,684 (website, disabled feature) tuples, one by each worker.

Figure 4 gives a histogram of the break rates for each of the 74 standards measured in this work. As the graph shows, removing over 60% of the measured standards resulted in no noticeable effect on the user's experience.

In some cases, this was because the standard was never observed being used⁴. In other cases, it was because the standard is intended to be used in a way that users do not notice⁵.

Other standards caused a large number of sites to break when removed from the browser. Disabling access to the *DOM 1* standard (which provides basic functionality for modifying the text and appearance of a document) broke an estimated 69.05% of the web.

A listing of the site break rate for all 74 standards is provided in the appendix in Table 4.

We note that these measurements only cover the interacting with a website as an unauthenticated user. It is possible that site feature use changes when users log into websites, since some sites only provide full functionality to registered users. These numbers only describe the functionality sites use before they've established a trust-relationship with the site (e.g. before they've created an account and logged into a web site).

5.2 Per-Standard Cost

As described in Section 4.5, we measure the cost of a Web API standard being available in the browser in three ways:fi rst by related research documenting security and privacy attacks that leverage the standard (Section 5.2.1), second by the number of historical CVEs reported against the standard since 2010 (Section 4.5.1), and third with a lower bound estimate of the number of ELoC needed to implement the standard in the browser (Section 4.5.2).

5.2.1 Security Costs - Attacks from Related Research. We searched the lastfi ve years of work published at major research conferences and journals for research on browser weaknesses related to Web API standards. These papers either explicitly identify either Web API standards, or features or functionality that belong to a Web API standard. In each case the standard was either necessary for the attack to succeed, or was used to make the attack faster or more reliable. While academic attacks do not aim to discover all possible vulnerabilities, the academic emphasis on novelty mean that the Web API standards implicated in these attacks allow a new, previously undiscovered way to exploit the browser.

The most frequently cited standard was the *High Resolution Time Level 2* [9] standard, which provides highly accurate, millisecond-resolution timers. Seven papers published since 2013 leverage the standard to break the isolation protections provided by the browser, such as learning information about the environment the browser is running in [31, 34, 49], learning information about other open browser windows [16, 31, 38], and gaining identifying information from other domains [59].

Other implicated standards include the *Canvas* standard, which was identified by researchers as allowing attackers to persistently track users across websites [12], learn about the browser's execution environment [34] or obtain information from other browsing windows [38], and the *Media Capture and Streams* standard, which was used by researchers to perform "cross-site request forgery, history sniffing, and information stealing" attacks [57].

In total we identified 20 papers leveraging 23 standards to attack the privacy and security protections of the web browser. Citations for these papers are included in Table 4.

5.2.2 Security Costs - CVEs. Vulnerability reports are not evenly distributed across browser standards. Figure 5 presents this comparison of standard benefit (measured by the number of sites that require the standard to function) on the y-axis, and the number of severe CVEs historically associated with the standard on the x-axis. A plot of all CVEs (not just high and severe ones), is included in the appendix as Figure 7. It shows the same general relationships between break rate and CVEs as Figure 5, and is included for completeness.

 $^{^4}$ e.x. the WebVTT standard, which allows document authors to synchronize text changes with media playing on the page.

⁵e.x. the *Beacon* standard, which allows content authors to trigger code execution when a user browses away from a website.

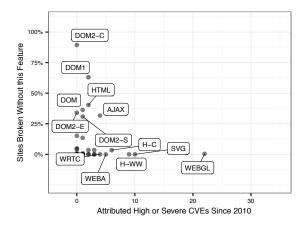


Figure 5: A scatter plot showing the number of "high" or "severe" CVEsfi led against each standard since 2010, by how many sites in the Alexa 10k break when the standard is removed.

Points in the upper-left of the graph depict standards that are high benefit, low cost, i.e. standards that are frequently required on the web but have rarely (or never) been implicated in CVEs. For example, consider the *Document Object Model (DOM) Level 2 Events Specification* standard, denoted by **DOM2-E** in Figure 5. This standard defines how website authors can associate functionality with page events such as button clicks and mouse movement. This standard is highly beneficial to browser users, being required by 34% of pages to function correctly. Enabling the standard comes with little risk to web users, being associated with zero CVEs since 2010.

Standards in the lower-right section of the graph, by contrast, are low benefit, high cost standards, when using historical CVE counts as an estimate of security cost. The *WebGL Specification* standard, denoted by **WEBGL** in Figure 5, is an example of such a low-benefit, high-cost standard. The standard allows websites to take advantage of graphics hardware on the browsing device for 3D graphics and other advanced image generation. The standard is needed for less than 1% of web sites in the Alexa 10k to function correctly, but is implicated in 22 high or severe CVEs since 2010. How infrequently this standard is needed on the web, compared with how often the standard has previously been the cause of security vulnerabilities, suggests that the standard poses a high security risk to users going forward, with little attenuating benefit.

As Figures 7 and 5 show, some standards have historically put users at much greater risk than others. Given that for many of these standards the risk has come with little benefit to users, these standards are good candidates for disabling when visiting untrusted websites.

5.2.3 Security Costs - Implementation Complexity. We further found that the cost of implementing standards in the browser are not equal, and that some standards have far more complex implementations than others (with complexity measured as the ELoC uniquely needed to implement a given standard). Figure 6 presents a comparison of standard benefit (again measured by the number

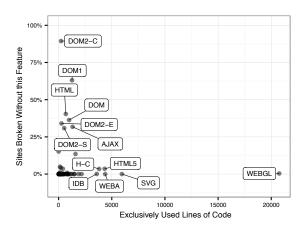


Figure 6: A scatter plot showing the LOC measured to implement each standard, by how many sites in the Alexa 10k break when the standard is removed.

of sites that require the standard to function) and the exclusive lines of code needed to implement the standard, using the method described in section 4.5.2.

Points in the upper-left of Figure 6 depict standards that are frequently needed on the web for sites for function correctly, but which have relatively non-complex implementations. One example of such a standard is the *Document Object Model (DOM) Level 2 Core Specification* standard, denoted by **DOM2-C**. This standard provides extensions the browser's basic document modification methods, most popularly, the Document.prototype.createDocumentFragment method, which allows websites to quickly create and append subdocuments to the current website. This method is needed for 89% of websites to function correctly, suggesting it is highly beneficial to web users to have it enabled in their browser. The standard comes with a low security cost to users as well; our technique identifies only 225 exclusive lines of code that are in the codebase solely to enable this standard.

Points in the lower-right of thefi gure depict standards that provide infrequent benefit to browser users, but which are responsible for a great deal of complexity in the browser's code base. The *Scalable Vector Graphics (SVG) 1.1 (Second Edition)* standard, denoted by **SVG**, is an example of such a high-cost, low-benefit standard. The standards allows website authors to dynamically create and interact with embedded SVG documents through JavaScript. The standard is required for core functionality in approximately 0% of websites on the Alexa 10k, while adding a large amount of complexity to the browser's code base (at least 5,949 exclusive lines of code, more than our technique identified for any other standard).

5.3 Threats to Validity

The main threat to validity in this experiment is the accuracy of our human-executed casual browsing scenario. With respect to internal validity, the high agreement between the two users performing tasks on the same sites lends credence to the claim that the users were able to successfully exercise most or all of the functionality that a casual browser might encounter. The students who worked

on this project spent over 500 hours combined performing these casual browsing tasks and recording their results, and while they were completely separated while actively browsing, they spent a good deal of time comparing notes about how to fully exercise the functionality of a website within the 70 second time window for each site.

External validity, i.e. the extent to which our results can be generalized, is also a concern. However, visiting a website for 70 or fewer seconds encapsulates 80% of all web page visits according to [41], thus accurately representing a majority of web browsing activity, especially when visiting untrusted websites. Furthermore, while our experiment does not evaluate the JavaScript functionality that is only available to authenticated users, we posit that protection against unknown sites—the content aggregators, pop-up ads, or occasionally consulted websites that a user does not interact with enough to trust—are precisely the sites with which the user should exercise the most caution.

6 USABILITY EVALUATION

This section describes how we evaluated the usability of our feature-restricting approach, to determine whether the security benefits discussed in Section 5 could be achieved without negatively effecting common browsing experiences across a broad range of websites. We performed this evaluation in two steps. First, we selected two sets of Web API standards to prevent websites from accessing by default, each representing a different trade off between affecting the functionality of existing sites and improving browser security. Second, we implemented these hardened browser configurations using the browser extension mentioned in Section 7, and compared their usability against other popular browser hardening techniques.

6.1 Selecting Configurations

To evaluate the utility and usability of ourfi ne grained, standardsfocused approach to browser hardening, we created two hardened browser configurations.

Table 3 lists the standards that we blocked for the conservative and aggressive hardened browser configurations. Our **conservative** configuration focuses on removing features that are infrequently needed by websites to function, and would befi tting for users who desire more security than is typical of a commodity web browser, and are tolerant of a slight loss of functionality. Our **aggressive** configuration focuses on removing attack surface from the browser, even when that necessitates breaking more websites. This configuration wouldfit highly security sensitive environments, where users are willing to accept breaking a higher percentage of websites in order to gain further security

We selected these profiles based on the data discussed in Section 5, related previous work on how often standards are needed by websites [54], and prioritizing not affecting the functionality of the most popular sites on the web. We further chose to not restrict the *Web Crypto* standard, to avoid affecting the critical path of security senstivie code.

We note that these are just two possible configurations, and that users (or trusted curators, IT administrators, or other sources) could use this method tofi nd the security / usability tradeoff that bestfit their needs.

Statistic	Conservative	Aggressive
Standards blocked	15	45
Previous CVEs #	89	123
Previous CVEs %	52.0%	71.9%
LOC Removed #	37,848	53,518
LOC Removed %	50.00%	70.76%
% Popular sites broken	7.14%	15.71%
% Less popular sites broken	3.87%	11.61%

Table 1: Cost and benefit statistics for the evaluated conservative and aggressive browser configurations.

We evaluated the usability and the security gains these hardened browser configurations provided. Table 1 shows the results of this evaluation. As expected, blocking more standards resulted in a more secure browser, but at some cost to usability (measured by the number of broken sites).

Our evolution was carried out similarly to the per-standard measurement technique described in Section 4.4. First we created two sets of test sites, **popular** sites (the 200 most popular sites in the Alexa 10k that are in English and not pornographic) and **less popular sites** (a random sampling of sites from the Alexa 10k that are rank 201 or lower). This yielded 175 test sites in the popular category, and 155 in the less popular category.

Next we had two evaluators visit each of these 330 websites under three browsing configurations, for 60 seconds each. Our decision to use 60 seconds per page is based on prior research [41] finding that that users on average spend under a minute per page.

Our evaluators first visited each site in an unmodified Firefox browser, to determine the author-intended functionality of the website. Second, they visited in a Firefox browser in the above mentioned conservative configuration. And then fi nally, a third time in the aggressive hardened configuration.

For the conservative and aggressive tests, the evaluators recorded how the modified browser configurations affected each page, using the same 1–3 scale described in Section 4.4. Our evaluators independently gave each site the same 1–3 ranking 97.6% of the time for popular sites, and 98.3% of the time for less popular sites, giving us a high degree of confidence in their evaluations. The "% Popular sites broken" and "% Less popular sites broken" rows in Table 1 give the results of this measurement.

To further increase our confidence the reported site-break rates, our evaluators recorded, in text, what broken functionality they encountered. We were then able to randomly sample and check these textual descriptions, and ensure that our evaluators were experiencing similar broken functionality. The consistency we observed through this sampling supports the internal validity of the reported site break rates.

As Table 1 shows, the trade off between gained security and lessened usability is non-linear. The conservative configuration disables code paths associated with 52% of previous CVEs, and removes 50% of ELoC, while affecting the functionally of only 3.87%-7.14% of sites on the internet. Similarly, the aggressive configuration disables 71.9% of code paths associated with previous CVEs and

	% Popular sites broken	% Less popular sites broken	Sites tested
Conservative Profile	7.14%	3.87%	330
Aggressive Profile	15.71%	11.61%	330
Tor Browser Bundle	16.28%	7.50%	100
NoScript	40.86%	43.87%	330

Table 2: How many popular and less popular sites break when using conservative and aggressive hardening profiles, versus other popular browser security tools.

over 70% of ELoC, while affecting the usability of 11.61%-15.71% of the web.

6.2 Usability Comparison

We compared the usability of our sample browser configurations against other popular browser security tools. We compared our conservative and aggressive configurations is rst with Tor Browser and NoScript, each discussed in Section 2.2. Wefi nd that the conservative configuration has the highest usability of all four tested tools, and that the aggressive hardened configuration is roughly comparable to the default configuration of the Tor Browser. The results of this comparison are given in Table 2.

We note that this comparison is not included to imply which method is the most secure. The types of security problems addressed by each of these approaches are largely intended to solve different types of problems, and all three compose well (i.e., one could use a cost-benefit method to determine which Web API standards to enable *and* harden the build environment and route traffic through the Tor network *and* apply per-origin rules to script execution). However, as Tor Browser and NoScript are widely used security tools, comparing against them gives a good baseline for usability for security conscious users.

We tested the usability using the same technique we used for the conservative and aggressive browser configurations, described in Section 6.1; the same two evaluators visited the same 175 popular and 155 less popular sites, but compared the page in an unmodified Firefox browser with the default configuration of the NoScript extension.

The same comparison was carried out for default Firefox against the default configuration of the Tor Browser bundle 6 . The evaluators again reported very similar scores in their evaluation, reaching the same score 99.75% of the time when evaluating NoScript and 90.35% when evaluating the Tor Browser. We expect this lower agreement score for the Tor Browser is a result of our evaluators being routed differently through the Tor network, and receiving different versions of the website based on the location of their exit nodes. 7

As Table 2 shows, the usability of our conservative and aggressive configurations is as good as or better than other popularly used browser security tools. This suggests that, while our Web API

standards cost-benefit approach has some affect on usability, it is a cost security-sensitive users would accept.

6.3 Allowing Features For Trusted Applications

We further evaluated our approach by attempting to use several popular, complex JavaScript applications in a browser in the **aggressive** hardened configuration. We then created application-specific configurations to allow these applications to run, but with access to only the minimal set of features needed for functionality.

This process of creating specific feature configurations for different applications is roughly analogous to granting trusted applications additional capabilities (in the context of a permissions based system), or allowing trusted domains to run JavaScript code (in the context of browser security extensions, like NoScript).

We built these application specific configurations using a tool-assisted, trial and error process:fi rst, we visited the application with the browser extension in "debug" mode, which caused the extension to log blocked functionality. Next, when we encountered a part of the web application that did not function correctly, we reviewed the extension's log to see what blocked functionality seemed related to the error. We then iteratively enabled the related blocked standards and revisited the application, to see if enabling the standard allowed the app to function correctly. We repeated the above steps until the app worked as desired.

This process is would be beyond what typical web users would be capable of, or interested in doing. Users who were interested in improving the security of their browser, but not interested in creating hardened app configurations themselves, could subscribe to trusted, expert curated polices, similar to how users of AdBlock Plus receive community created rules from EasyList. Section 8.2 discusses ways that rulesets could be distributed to users.

For each of the following tests, we started with a browser configured in the previously mentioned **aggressive** hardened configuration, which disables 42 of the 74 Web API standards measured in this work. We then created application-specific configurations for three popular, complex web applications, enabling only the additional standards needed to allow each application to work correctly (as judged from the user's perspective).

First, we watched videos on YouTube, byfi rst searching for videos on the site's homepage, clicking on a video to watch, watching the video on its specific page, and then expanding the video's display to full-screen. Doing so required enabling three standards that are blocked in our **aggressive** configuration: the *File API* standard ⁸, the *Media Source Extensions* standard ⁹, and the *Fullscreen API* standard. Once we enabled these three standards on the site, we were able to search for and watch videos on the site, while still having 39 other standards disabled.

Second, we used the Google Drive application to write and save a text document, formatting the text using the formatting features provided by the website (creating bulleted lists, altering justifications, changing fonts and text sizes, embedding links, etc.). Doing so required enabling two standards that are by default blocked in our

 $^{^6\}mathrm{Smaller}$ sample sizes were used when evaluating the Tor Browser because of time constraints, not for fundamental methodological reasons.

 $^{^7\}mathrm{We}$ chose to not fix the Tor exit node in an xed location during this evaluation to accurately recreate the experience of using the default configuration of the TBB.

 $^{^8{\}mbox{You}}{\mbox{Tube}}$ uses methods defined in this standard to create URL strings referring to media on the page.

⁹YouTube uses the HTMLVideoElement.prototype.getVideoPlaybackQuality method from this standard to calibrate video quality based on bandwith.

aggressive configuration: the *HTML*: *Web Storage* standard ¹⁰ and the *UI Events* standard ¹¹. Allowing Google Docs to access these two additional standards, but leaving the other 40 standards disabled, allowed us create rich text documents without any user-noticeable affect in site functionality.

Third andfi nally, we used the Google Maps application to map a route between Chicago and New York. We did so byfi rst searching for "Chicago, IL", allowing the map to zoom in on the city, clicking the "Directions" button, searching for "New York, NY", and then selecting the "driving directions" option. Once we enabled the *HTML: Channel Messaging* standard ¹² we were able to use the site as normal.

7 BROWSER EXTENSION

As part of this work, we are also releasing a Firefox browser extension that allows users to harden their browsers using the same standard disabling technique described in this paper. The extension is available as source code¹³.

7.1 Implementation

Our browser extension uses the same Web API standard disabling technique described in Section 3 to dynamically control the DOM-related attack surface to expose to websites. The extension allows users to deploy the same conservative and aggressive hardened browser configurations described in Section 6.1. Extension users can also create their own hardened configurations by selecting any permutation of the 74 measured Web API standards to disable.

Hardened configurations can be adjusted over time, as the relative security and benefit of different browser features changes. Thisfi xed-core-functionality, updated-policies deployment model works well for popular web-modifying browser extensions (such as AdBlock, PrivacyBadger and Ghostery). Our browser-hardening extension similarly allows users to subscribe to configuration updates from external sources (trusted members of the security community, a company's IT staff, security-and-privacy advice groups, etc.), or allows users to create their own configurations.

If a browser standard were found to be vulnerable to new attacks in the future, security sensitive users could update their hardened configurations to remove it. Likewise, if other features became more popular or useful to users on the web, future hardened configurations could be updated to allow those standards. The extension enables users to define their own cost-benefit balance in the security of their browser, rather than prescribing a specific configuration.

Finally, the tool allows users to create per-origin attack-surface policies, so that trusted sites can be granted access to more JavaScript-accessible features and standards than unknown or untrusted websites. Similar to, butfi ner grained than, the origin based policies of tools like NoScript, this approach allows users to better limit websites to the least privilege needed to carry out the sites' desired functionality.

We discussed our approach with engineers at Mozilla, and we are investigating how our feature usage measurement and blocking techniques could be incorporated into Firefox Test Pilot as an experimental feature. This capability would allow wider deployment of this technique within a genuine browsing environment, which can also improve the external validity of our measurements.

7.2 Tradeoffs and Limitations

Implementing our approach as a browser extension entails significant tradeoffs. It has the benefit of being easy for users to install and update, and that it works on popular browsers already. The extension approach also protect users from vulnerabilities that depends on accessing a JavaScript-exposed method or data structure (of which there are many, as documented in Section 5.2.2), with minimal re-engineering effort, allowing policies to be updated quickly, as security needs change. Finally, the Web API standard-blocking, extension approach is also useful for disabling large portions of high-risk functionality, which could protect users from not-yet-discovered bugs, in a way that ad-hocfi xing of known bugs could not.

There are several significant downsides to the extension-based approach however. First is that there are substantial categories of browser exploits that our extension-based approach cannot guard against. Our approach does not provide protection against exploits that rely on browser functionality that is reachable through means other than JavaScript-exposed functionality. The extension would not provide protection against, for example, exploits in the browser's CSS parser, TLS code, or image parsers (since the attacker would not require JavaScript to access such code-paths).

Additionally, the extension approach does not have access to some information that could be used to make more sophisticated decisions about when to allow a website to access a feature. An alternate approach that modified the browser could use factors such as the state of the stack at call time (e.x. distinguishing between first-and-third party calls to a Web API standard), or where a function was defined (e.x. whether a function was defined in JavaScript code delivered over TLS from a trusted website). Because such information is not exposed to the browser in JavaScript, our extension is not able to take advantage of such information.

8 DISCUSSION

Below we outline some techniques which can be used with our extension to maximize functionality for trusted websites while simultaneously limiting the threat posed by unknown, untrusted sites.

8.1 Potential Standards for Disabling

Standards that impose a large cost to the security and privacy of browser users, while providing little corresponding benefit to users, should be considered for removal from the browser. While historically such steps are rare, Mozilla's decision to remove the *Battery API* shows that Web API standard removal is feasible.

We identify several standards as candidates for removal from the browser, based on the low benefit they provide, and the high risk they pose to users' privacy and security. The *High Resolution Time Level 2, Canvas* and *Web Audio* APIs have all been leveraged

 $^{^{10}}$ Google Drive uses functionality from this standard to track user state between pages.

¹¹Google Drive uses this standard forfi ner-grained detection of where the mouse cursor is clicking in the application's interface.

¹²Which Google Maps uses to enable communication between different sub-parts of the application.

 $^{^{13}} https://github.com/snyderp/firefox-api-blocking-extension \\$

in attacks in academic security research and have been associated with CVEs (several severe). With perfect agreement, our testers did not encounter any sites with broken functionality when these standards were removed.

While its easy to imagine use cases for each of these standards, our measurements indicate that such use cases are rare. The overwhelming majority of websites do not require them to deliver their content to users. Disabling these standards by default, and requiring users to actively enable them, much like access to a user's location or webcam, would improve browser security at a minimal cost to user convenience.

8.2 Dynamic Policy Configuration

Our evaluation uses a global policy for all websites. This approach could be modified to apply different levels of trust to different origins of code, similar to what TBB and NoScript do. A set of community-derived feature rules could also be maintained for different websites, much like the EasyList ad blockerfi lter [27], with our conservative and aggressive profiles serving as sensible defaults.

One could also apply heuristics to infer a user's level of trust with a given website. When visiting a site for thefi rst time, a user has no preexisting relationship with that origin. Under this insight, different features could be exposed depending on how often a user visits a site, or whether the user has logged in to that website.

Similarly, browser vendors could reduce the set of enabled Web API standards in "private browsing modes", where users signal their desire for privacy, at the possible cost of some convenience. This signal is already being used, as Firefox enables enhanced tracking protection features when a user enables private browsing mode. Disabling high-cost standards in such a mode would be a further way to protect user privacy and security.

9 CONCLUSION

As browser vendors move away from plugins and provide more functionality natively within the DOM, the modern web browser has experienced a terrific growth in features available to every web page that a user might visit. Indeed, part of the appeal of the web is the ability to deploy complex, performant software without the user even realizing that it has happened. ¹⁴

However, the one sizefi ts all approach to exposing these features to websites has a cost which is borne in terms of vulnerabilities, exploits, and attacks. Simplistic approaches like ripping out every feature that isn't absolutely necessary are not practical solutions to this problem. We believe that enabling users to contextually control and empirically decide which features are exposed to which websites will allow the web to continue to improve the browser's feature set and performance, while still being usable in high risk situations where the security of a reduced feature set is desired.

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¹⁴ https://xkcd.com/1367/

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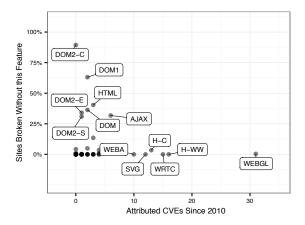


Figure 7: A scatter plot showing the number of CVEsfi led against each standard since 2010, by how many sites in the Alexa 10k break when the standard is removed.

A BROWSER CONFIGURATIONS

Conservative	Aggressive
X	X
	X
	X
	X
	X
X	X
X	X
X	X
X	X
X	X
X	X
X	X
X	X
X	X
	X
	X
	X
	X
	X
	X
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Table 3: Listing of which standards were disabled in the evaluated conservative and aggressive hardened browser configurations.

Standard Name	Abbreviation	# Alexa 10k Using	Site Break Rate	Agree %	# CVEs	# High or Severe	% ELoC	Enabled attacks
WebGL	WEBGL	852	<1%	93%	31	22	27.43	[15, 21, 34, 40]
HTML: Web Workers	H-WW	856	0%	100%	16	9	1.63	[30, 34]
WebRTC	WRTC	24	0%	93%	15	4	2.48	[15, 26]
HTML: The canvas element	H-C	6935	0%	100%	14	6	5.03	[12, 15, 21, 26, 34, 38, 40]
Scalable Vector Graphics	SVG	1516	0%	98%	13	10	7.86	
Web Audio API	WEBA	148	0%	100%	10	5	5.79	[15, 26]
XMLHttpRequest	AJAX	7806	32%	82%	11	4	1.73	[,
HTML	HTML	8939	40%	85%	6	2	0.89	[13, 46]
HTML 5	HTML5	6882	4%	97%	5	2	5.72	[,]
Service Workers	SW	0	0%	-	5	0	2.84	[28, 59, 60]
HTML: Web Sockets	H-WS	514	0%	95%	5	3	0.67	[20, 07, 00]
HTML: History Interface	H-HI	1481	1%	96%	5	1	1.04	
Indexed Database API	IDB	288	<1%	100%	4	2	4.73	[12, 15]
Web Cryptography API	WCR	7048	4%	90%	4	3	0.52	[12, 13]
Media Capture and Streams	MCS	49	0%	95%	4	3	1.08	[57]
DOM Level 2: HTML	DOM2-H			95% 89%	3		2.09	[3/]
DOM Level 2: Traversal and Range	DOM2-H DOM2-T	8956 4406	13%	100%	3	1 2	0.04	
ē								
HTML 5.1	HTML51	2	0%	100%	3	1	1.18	
Resource Timing	RT	433	0%	98%	3	0	0.10	
Fullscreen API	FULL	229	0%	95%	3	1	0.12	
Beacon	BE	2302	0%	100%	2	0	0.23	
DOM Level 1	DOM1	9113	63%	96%	2	2	1.66	
DOM Parsing and Serialization	DOM-PS	2814	0%	83%	2	1	0.31	
DOM Level 2: Events	DOM2-E	9038	34%	96%	2	0	0.35	
DOM Level 2: Style	DOM2-S	8773	31%	93%	2	1	0.69	
Fetch	F	63	<1%	90%	2	0	1.14	[28, 59, 60]
CSS Object Model	CSS-OM	8094	5%	94%	1	0	0.17	[46]
DOM	DOM	9050	36%	94%	1	1	1.29	
HTML: Plugins	H-P	92	0%	100%	1	1	0.98	[13, 15]
File API	FA	1672	0%	83%	1	0	1.46	
Gamepad	GP	1	0%	71%	1	1	0.07	
Geolocation API	GEO	153	0%	96%	1	0	0.26	[35, 63]
High Resolution Time Level 2	HRT	5665	0%	100%	1	0	0.02	[16, 28, 30, 31, 34, 38, 49, 59]
HTML: Channel Messaging	H-CM	4964	0%	0.025	1	0	0.40	[55, 62]
Navigation Timing	NT	64	0%	98%	1	0	0.09	
Web Notifications	WN	15	0%	100%	1	1	0.82	
Page Visibility (Second Edition)	PV	0	0%	-	1	1	0.02	
UI Events	UIE	1030	<1%	100%	1	0	0.47	
Vibration API	V	1	0%	100%	1	1	0.08	
Console API	CO	3	0%	100%	0	0	0.59	[34]
CSSOM View Module	CSS-VM	4538	0%	100%	0	0	2.85	[13]
Battery Status API	BA	2317	0%	100%	0	0	0.15	[15, 26, 46, 48]
CSS Conditional Rules Module Lvl 3	CSS-CR	416	0%	100%	0	0	0.15	[13, 20, 10, 10]
CSS Font Loading Module Level 3	CSS-FO	2287	0%	98%	0	0	1.24	[13 15]
=								[13, 15]
DeviceOrientation Event	DO DOM2 C	0	0%	0707	0	0	0.06	[15, 23]
DOM Level 2: Core	DOM2-C	8896	89%	97%	0	0	0.29	
DOM Level 3: Core	DOM3-C	8411	4%	96%	0	0	0.25	
DOM Level 3: XPath	DOM3-X	364	1%	97%	0	0	0.16	
Encrypted Media Extensions	EME	9	0%	100%	0	0	1.91	[17] 04 (0]
HTML: Web Storage	H-WB	7806	0%	83%	0	0	0.55	[15, 34, 63]
Media Source Extensions	MSE	1240	0%	95%	0	0	1.97	
Selectors API Level 1	SLC	8611	15%	89%	0	0	0.00	
Script-based animation timing control	TC	3437	0%	100%	0	0	0.08	[46]
Ambient Light Sensor API	ALS	18	0%	89%	0	0	0.00	[46, 47]

Table 4: This table includes data on all 74 measured Web API standards, excluding the 20 standards with a 0% break rate, 0 associated CVEs and accounting for less than one percent of measured effective lines of code:

- (1) The standard's full name
 (2) The abbreviation used when referencing this standard in the paper
 (3) The number of sites in the Alexa 10k using the standard, per [54]
- (4) The portion of measured sites that were broken by disabling the standard. (see Section 4.4)
- (5) The mean agreement between two independent testers' evaluation of sites visited while that feature was disabled (see Section 4.4)
 (6) The number of CVEs since 2010 associated with the feature
- (7) The number of CVEs since 2010 ranked as "high" or "severe"
- (8) The percentage of lines of code exclusively used to implement this standard, expressed as a percentage of all 75,650 lines found using this methodology (see Section 4.5.2).
- (9) Citations for papers describing attacks relying on the standard