SugarCoat:

Programmatically Generating Privacy-Preserving, Web-Compatible Resource Replacements for Content Blocking (CCS 2021)

Michael Smith[†], Pete Snyder^{*}, Benjamin Livshits^{*}, Deian Stefan[†]

[†]UC San Diego *Brave Software

About Brave: The Company

- Privacy focused browser
- Novel, private, performant, user first web funding model
- Opt-in, user-rewarding ad system
- Search engine: https://search.brave.com
- Video conferencing: https://talk.brave.com

About Brave: Research Department

- 5 researchers, 8 research-engineers
- Publication + product focused
- Topics like: privacy, security, cryptography, ML, etc.
- Standards bodies: IETF, W3C, WHATWG, etc.
- Active university <-> industry collaborations

About Brave: Deployed Privacy Research

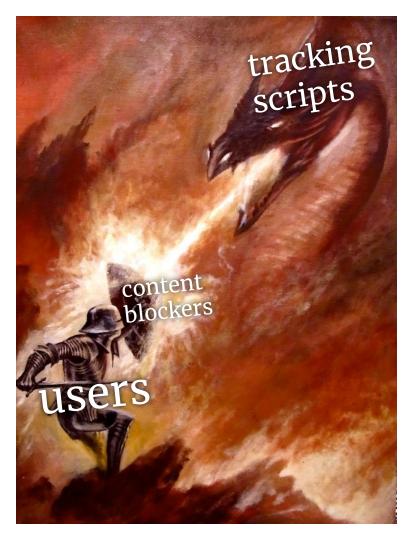
- Supporting filter-lists with behavioral fingerprinting of trackers (S&P 2021)
- Filter list maintenance and optimization (SIGMETRICS 2020)
- Compatibility of browser storage policies (WWW 2022)
- Automated webcompat detection, browser covert channels, navigational tracking, and more...

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37% (and growing)

of Web users rely on content blockers

M Malloy, M McNamara, A Cahn, and P Barford. 2016. Ad blockers: Global prevalence and impact. *IMC'16* 14–16–Nove (2016), 119–125. https://doi.org/10.1145/2987443.2987460





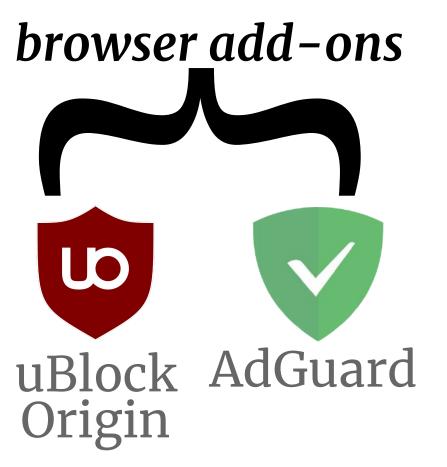
THREATS POLICY PRIVACY TECHNOLOGY WORKFORCE MONEY SPECIAL WATCH LISTEN EVENTS CONTENT

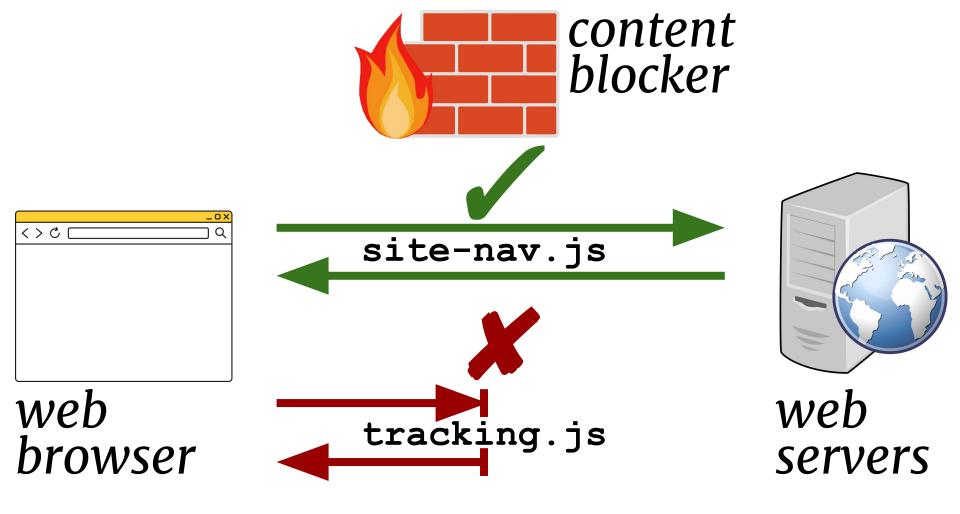
GOVERNMENT

CISA tells agencies to consider ad blockers to fend off 'malvertising'









EasyList /EasyPrivacy

—the largest filter list project

```
||a2z.com/sping?
 |aan.amazon.com^$third-party
 |activengage.com/overwatch/
 |ad-shield.io^$third-party
 |ad.aloodo.com^
 addthis.com/at/
 laddthis.com/live/
|addthiscdn.com/live/
 laddthisedge.com/live/
|addtoany.com/menu/transparent.gif
|adfox.yandex.ru^
|adlog.com.com^
|ads-trk.vidible.tv^
|affiliates.mgmmirage.com^
||affiliates.minglematch.com^
||affirm.com/api/v2/cookie sent
```

filter rules

EasyList /EasyPrivacy

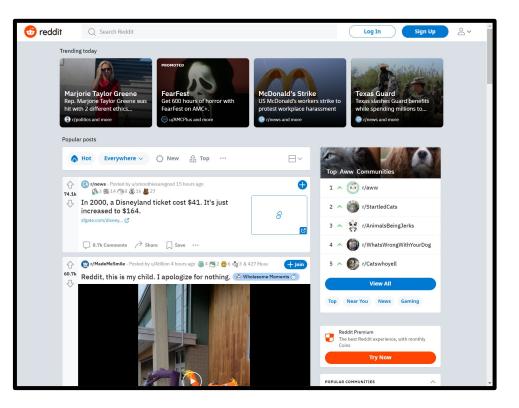
—the largest filter list project

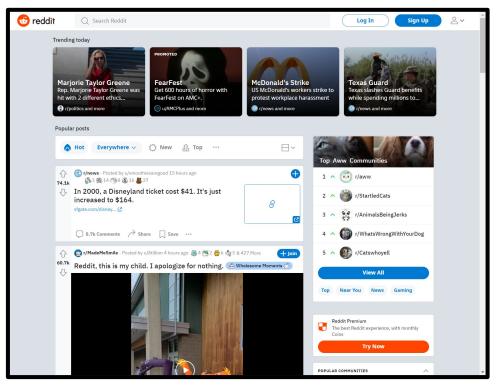


Brave Filter List Engineer @fanboynz

```
||a2z.com/sping?
|aan.amazon.com^$third-party
|activengage.com/overwatch/
 |ad-shield.io^$third-party
 lad.aloodo.com^
 |addthis.com/at/
laddthis.com/live/
|addthiscdn.com/live/
laddthisedge.com/live/
|addtoany.com/menu/transparent.gif
|adfox.yandex.ru^
|adlog.com.com^
|ads-trk.vidible.tv^
|affiliates.mgmmirage.com^
||affiliates.minglematch.com^
||affirm.com/api/v2/cookie sent
```

filter rules



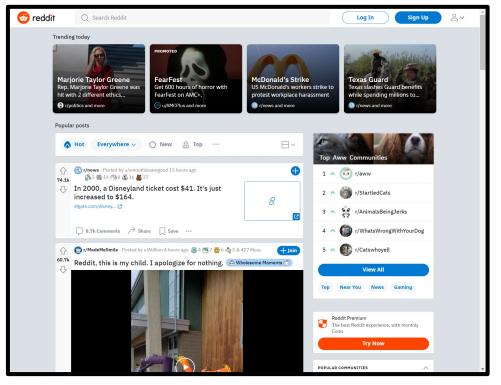


reddit-logo.svg

host: reddit-cdn.com

origin: reddit.com

type: image



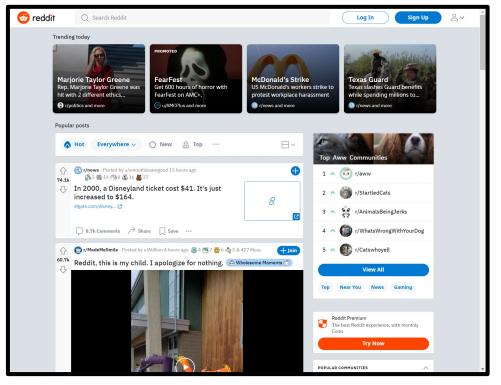
reddit-logo.svg

host: reddit-cdn.com

origin: reddit.com

type: image

decision:



reddit-logo.svg

host: reddit-cdn.com

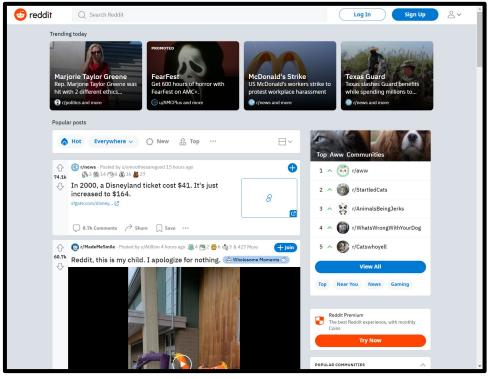
origin: reddit.com

type: image

decision:



allow



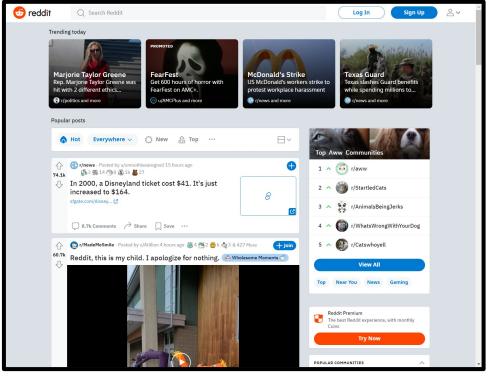
all-posts.json

host: api.reddit.com

origin: reddit.com

type: AJAX

decision:



all-posts.json

host: api.reddit.com

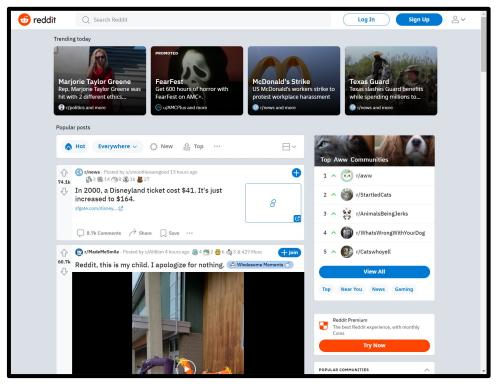
origin: reddit.com

type: AJAX

decision:



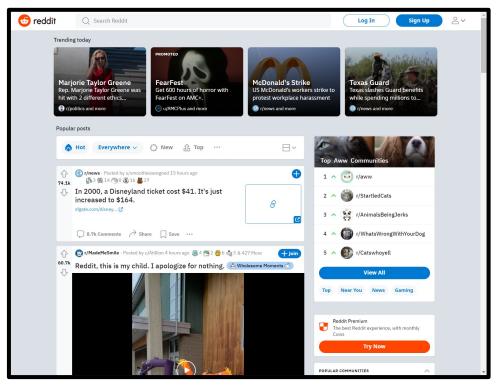
allow



host: doubleclick.com

origin: reddit.com

type: script

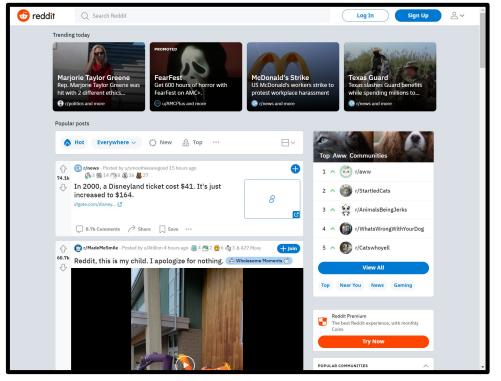


host: doubleclick.com

origin: reddit.com

type: script

decision:



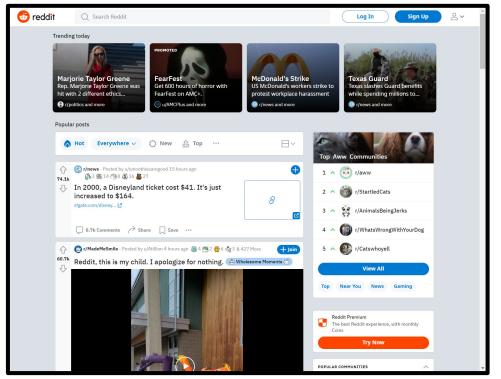
host: doubleclick.com

origin: reddit.com

type: script

decision:

```
...
||doubleclick.com/clicktrack.js
...
```

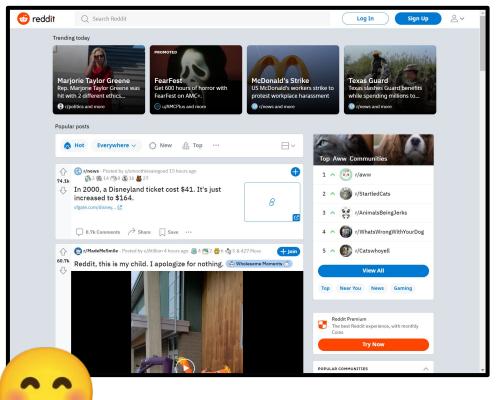


host: doubleclick.com

origin: reddit.com

type: script





host: doubleclick.com

origin: reddit.com

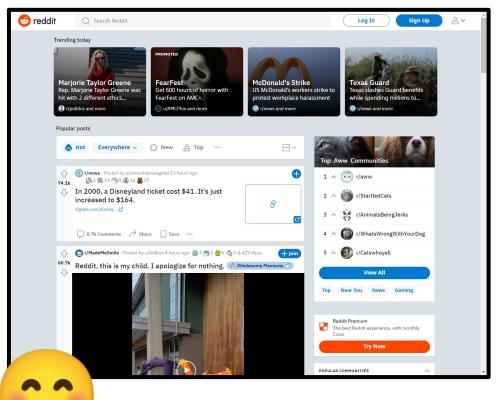
type: script



Is blocking a complete solution?

Is blocking a complete solution?

→ Where can blocking go wrong?

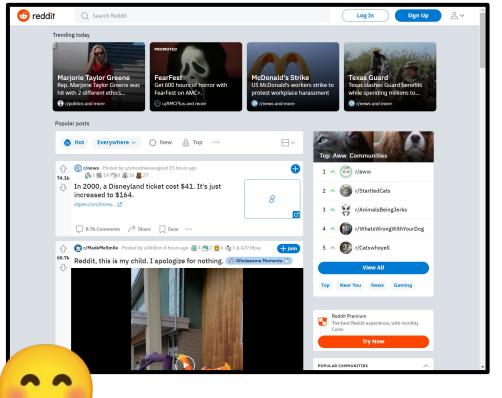


host: google-analytics.com

origin: reddit.com

type: script

decision:



host: google-analytics.com

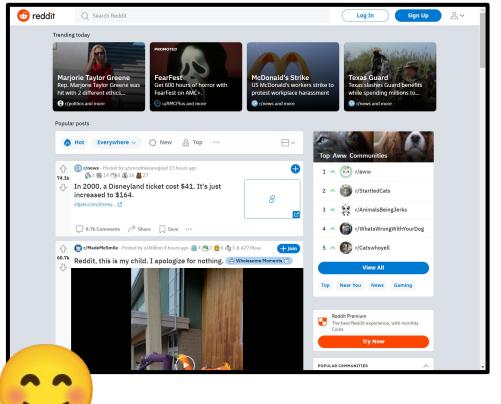
origin: reddit.com

type: script

decision:

```
...
||google-analytics.com/analytics.js
...
```

filter rule match



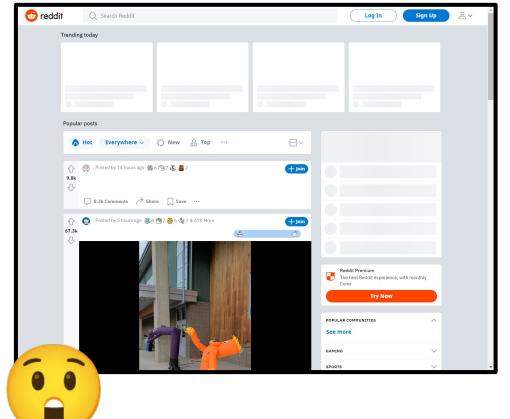
host: google-analytics.com

origin: reddit.com

type: script



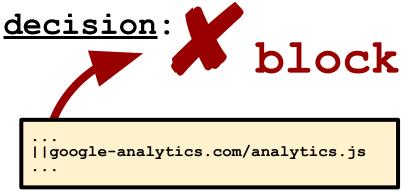
filter rule match



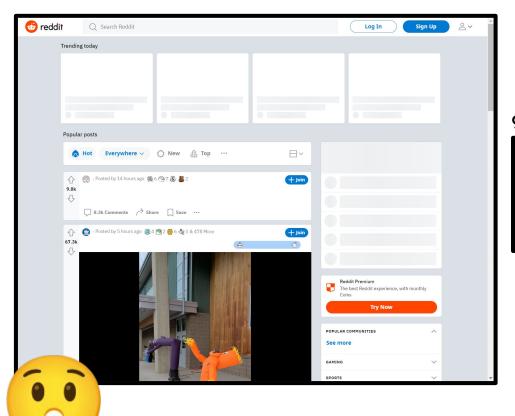
host: google-analytics.com

origin: reddit.com

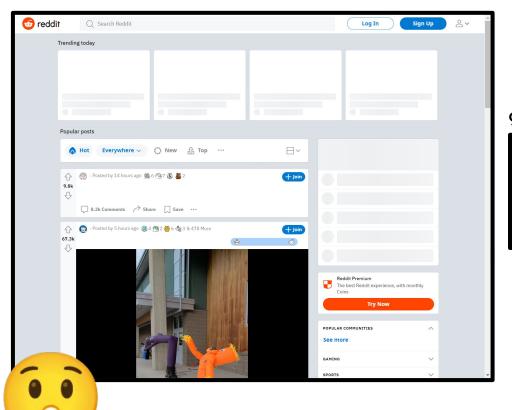
type: script



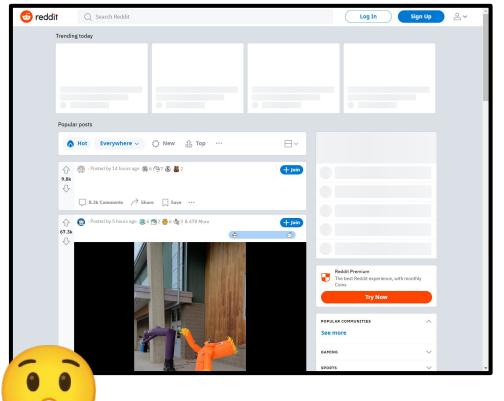
filter rule match



```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
```

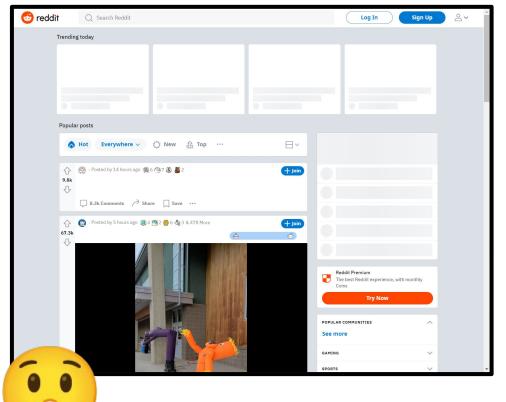


```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
```



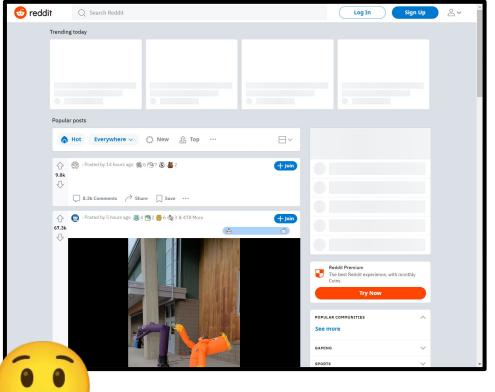
```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
...
```

reddit-cdn.com/FrontPage.js



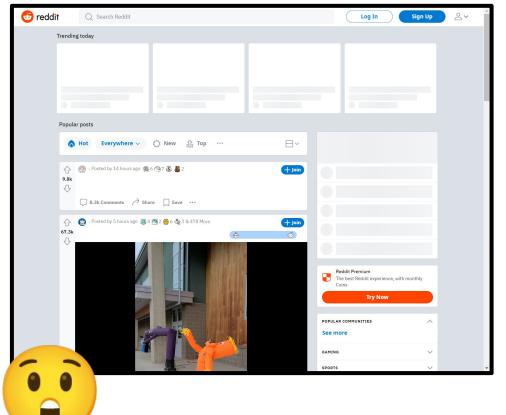
```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
...
```

reddit-cdn.com/FrontPage.js



```
window.ga = {};
ga.track = fur fon, vd, url, tag) {
    ...
};
...
```

reddit-cdn.com/FrontPage.js

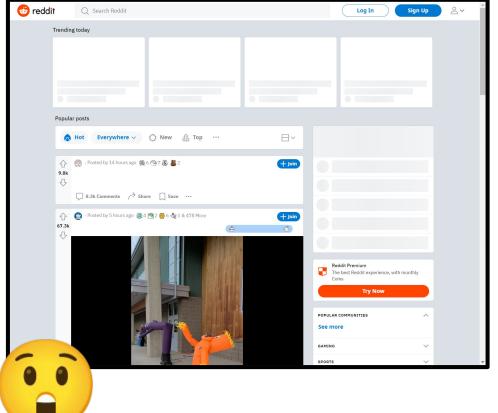


good -analytics.co /analytics.js

```
...
window.ga = {};
ga.track = fur fon, vd, url, tag) {
...
};
...
```

reddit-cdn.com/FrontPage.js

${ t ReferenceError}$



```
...
window.ga = {};
ga.track = fur fon, vd, url, tag) {
...
};
...
```

reddit-cdn.com/FrontPage.js

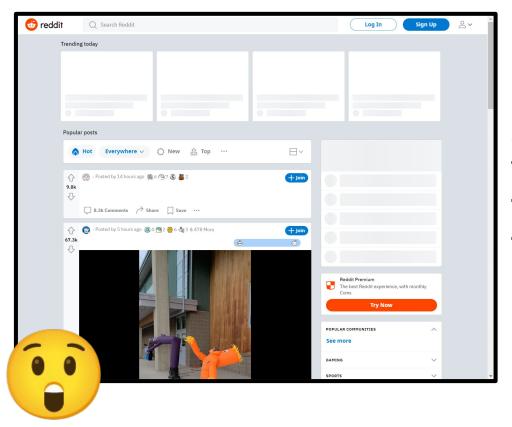
${ t Reference Error}$

So you broke Web compatibility.

Is that okay?

So you broke Web compatibility.

Is that okay? \rightarrow Not really, no.

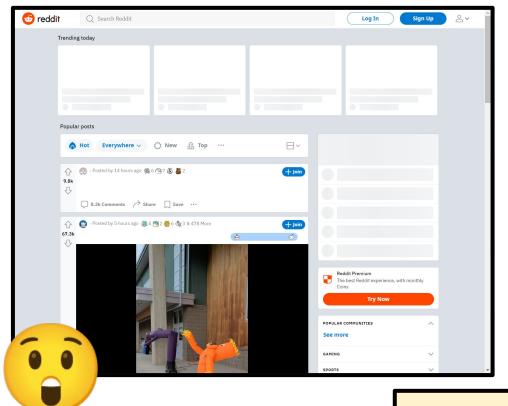


host: google-analytics.com

origin: reddit.com

type: script

Option #1: Exception Rules



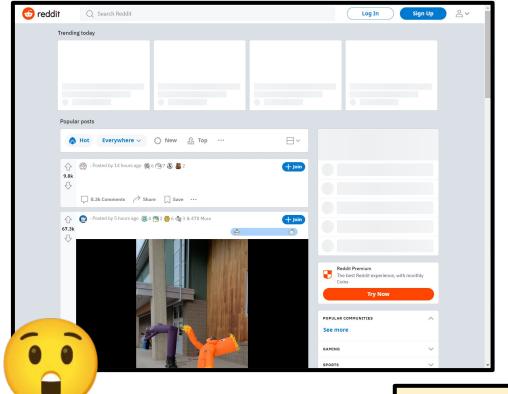
host: google-analytics.com

origin: reddit.com

type: script

Option #1: Exception Rules

...
@@||google-analytics.com/analytics.js,domain=reddit.com
...

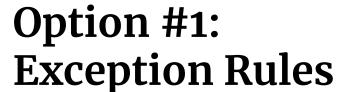


host: google-analytics.com

origin: reddit.com

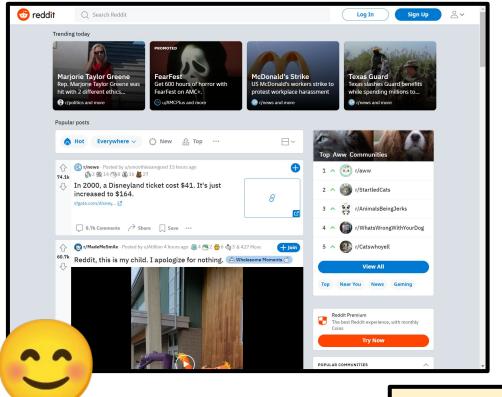
type: script

decision:



@@||google-analytics.com/analytics.js,domain=reddit.com
...

exception rule match



host: google-analytics.com

origin: reddit.com

script

decision:



Option #1: **Exception Rules**

Good: Repair Web compatibility

Good: Repair Web compatibility

Good: Easy to write

Good: Repair Web compatibility

Good: Easy to write

6,405
exception rules

(Brave, EasyList, EasyPrivacy, uBlock Origin)

Bad: Allow privacy harm

Good: Repair Web compatibility

Good: Easy to write

6,405 exception rules

(Brave, EasyList, EasyPrivacy, uBlock Origin)

Option #2: Resource Replacements

Option #2: Resource Replacements

google-analytics.com/analytics.js

```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
...
```

```
fake_ga.js
```

```
...
window.ga = {
    ...
    track (_kind, _url, _tag) {
        // Do nothing.
    },
    ...
};
```

"resource replacement"

Option #2: Resource Replacements

google-analytics.com/analytics.js

```
...
window.ga = {};
ga.track = function(kind, url, tag) {
...
};
...
```

```
fake_ga.js
```

```
window.ga = {
    ...
    track (_kind, _url, _tag) {
        // Do nothing.
    },
    ...
};
```

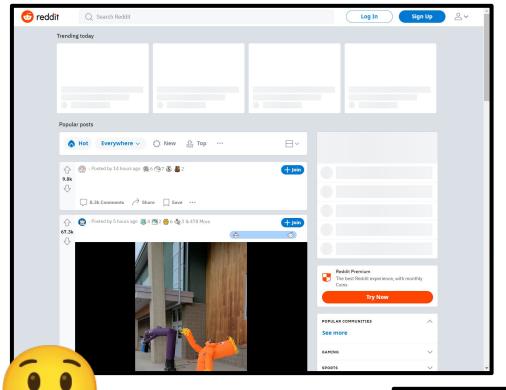
"resource replacement"

Option #2: Resource Replacements

google-analytics.com/analytics.js

```
window.ga = {};
ga.track = function(kind, url, tag) {
    ...
};
...
```

reddit-cdn.com/FrontPage.js

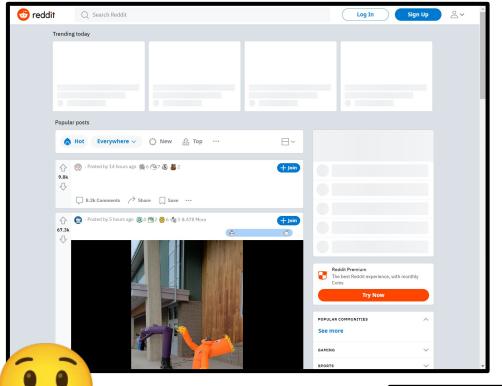


host: google-analytics.com

origin: reddit.com

type: script

```
...
||google-analytics.com/analytics.js,redirect=fake_ga.js
...
```



host: google-analytics.com

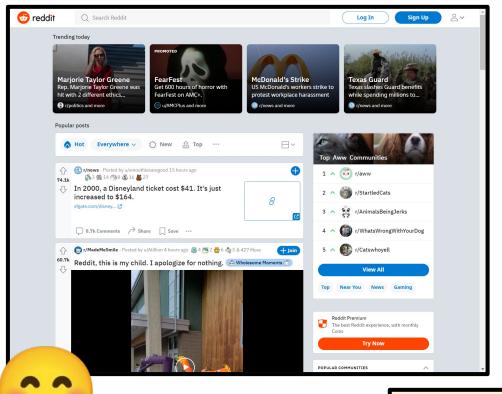
origin: reddit.com

type: script

decision:

... ||google-analytics.com/analytics.js,redirect=fake_ga.js

resource replacement rule match



host: google-analytics.com

origin: reddit.com

type: script

decision:
replace

||google-analytics.com/analytics.js,redirect=fake_ga.js

resource replacement rule match

Good: Repair Web compatibility

Good: Repair Web compatibility

Good: Prevent privacy harm

Good: Repair Web compatibility

Good: Prevent privacy harm

Bad: Need significant time and expertise

Good: Repair Web compatibility

Good: Prevent privacy harm

Bad: Need significant time and expertise

Bad: High maintenance costs

Good: Repair Web compatibility

Good: Prevent privacy harm

Bad: Need significant time and expertise

Bad: High maintenance costs

• 27

resource replacements

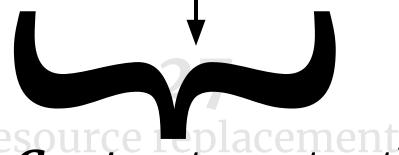
(Brave, uBlock Origin)

Good: Repair Web compatibility

Good: Prevent privacy harm

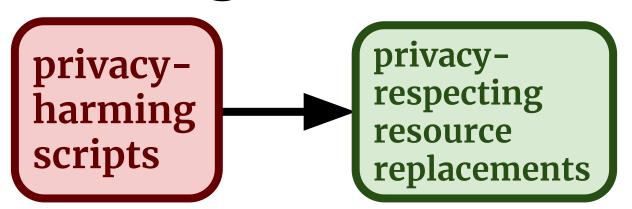
Bad: Need significant time and expertise

Bad: High maintenance costs



SugarCoat automates these!

SugarCoat



SugarCoat

privacyharming scripts

window.localStorage
document.cookies
fetch

SugarCoat

privacyharming scripts

```
$mockLocalStorage = ...;

...window.localStorage.

...document.cookies.

$mockCookies = ...;

$mockCookies = ...;

$mockFetch = ...;
```

- Q1: What behaviors of the scripts do we rewrite?
- Q2: What do we replace those script parts with?
- Q3: How do we locate those parts in script code?
- Q4: How do we actually transform script code?
- Q5: How do we know if it works?

```
var x = 1 + 2;
```

```
var x = 1 + 2;
var y = 'Hello ' + x;
```

```
var x = 1 + 2;
var y = 'Hello ' + x;
Math.min(x, 4);
```

→ We rewrite accesses to privacy-sensitive Web APIs.

Storage APIs

document.cookie

localStorage

sessionStorage

→ We rewrite accesses to privacy-sensitive Web APIs.

Storage APIs document.cookie localStorage sessionStorage used to **persist** tracking identifiers

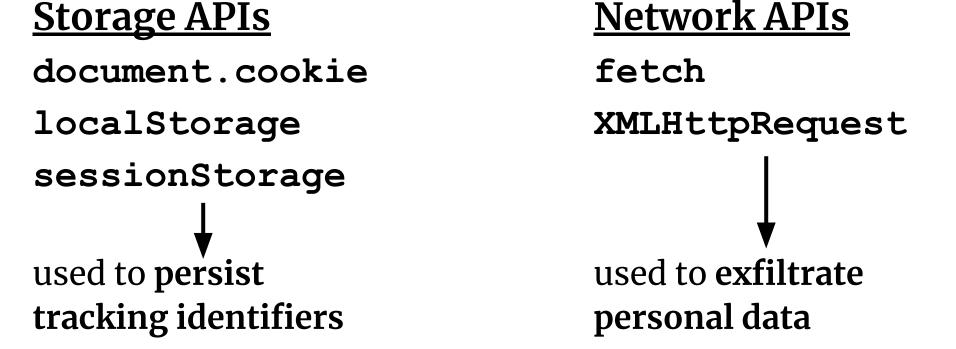
Q1: What behaviors of the scripts do we rewrite? → We rewrite accesses to privacy-sensitive Web APIs.

vve revirre accesses to privacy sensitive vveb in is.

Network APIs Storage APIs document.cookie fetch XMLHttpRequest localStorage sessionStorage used to **persist** tracking identifiers

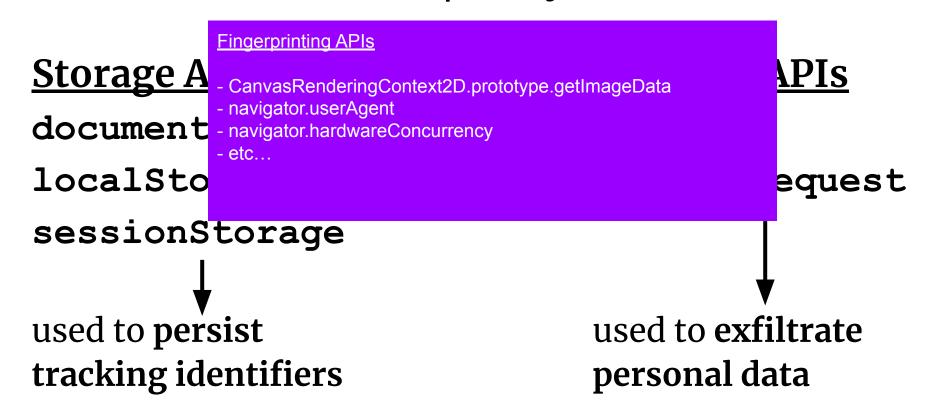
Q1: What behaviors of the scripts do we rewrite?

→ We rewrite accesses to privacy-sensitive Web APIs.



Q1: What behaviors of the scripts do we rewrite?

→ We rewrite accesses to privacy-sensitive Web APIs.



→ We redirect privacy-sensitive Web API accesses to mock implementations.

→ We redirect privacy-sensitive Web API accesses to mock implementations.

```
const fetch = async (url, init = null ) =>
  { throw new TypeError('Failed to fetch'); };
exports.fetch = {
  value: fetch, writable: true,
  configurable: true, enumerable: true
};
```

→ We redirect privacy-sensitive Web API accesses to mock implementations.

```
const fetch = async (url, init = null ) =>
  { throw new TypeError('Failed to fetch'); };
exports.fetch = {
  value: fetch, writable: true,
  configurable: true, enumerable: true
};
```

Mocks are write-once, and reusable between resource replacement scripts.

- Q1: What parts of the scripts do we rewrite?
- Q2: What do we replace those script parts with?
- Q3: How do we locate those parts in script code?
- Q4: How do we actually transform script code?
- Q5: How do we know if it works?

Q1: What parts of the scripts do we rewrite?

Q2: What do we replace those script parts with?

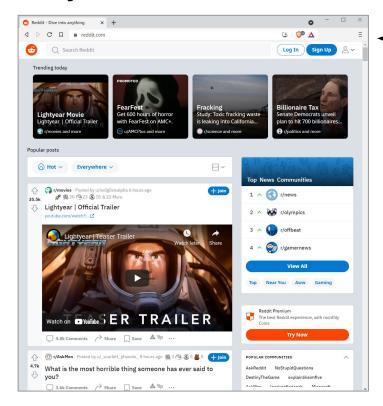
Q3: How do we locate those parts in script code?

Q4: How do we actually transform script code?

Q5: How do we know if it works?

- Q1: What parts of the scripts do we rewrite?
- Q2: What do we replace those script parts with?
- Q3: How do we locate those parts in script code?
- Q4: How do we actually transform script code?
- Q5: How do we know if it works?

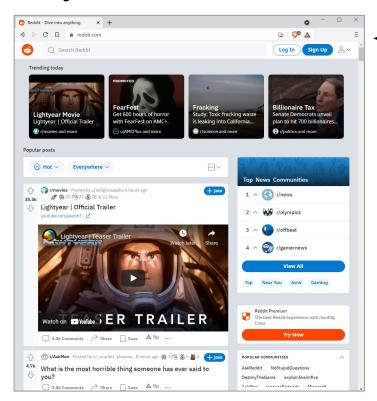
→ Dynamic runtime instrumentation of page behavior.





PageGraph-enabled build of the Brave Browser

→ Dynamic runtime instrumentation of page behavior.

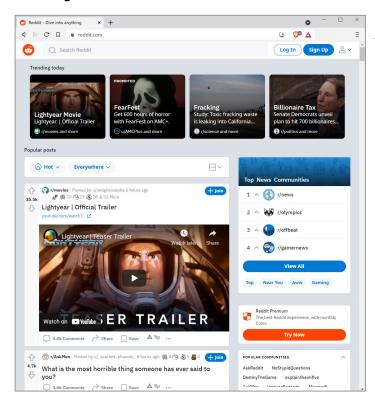




PageGraph-enabled build of the Brave Browser

https://github.com/brave/brave-browser/wiki/PageGraph

→ Dynamic runtime instrumentation of page behavior.

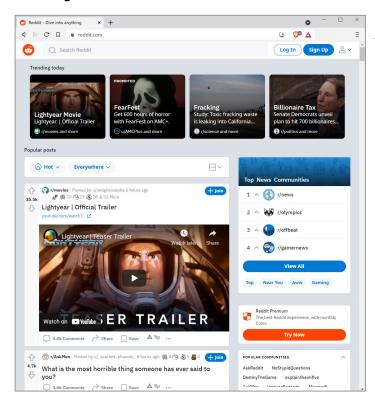




PageGraph-enabled build of the Brave Browser

```
Script actor
id=789,
type="classic",
url="jQuery.js",
src="..."
```

→ Dynamic runtime instrumentation of page behavior.





PageGraph-enabled build of the Brave Browser

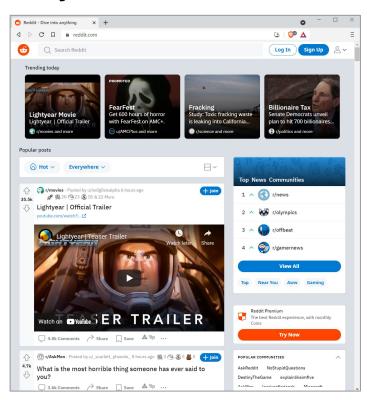
Script actor

id=789,
type="classic",
url="jQuery.js",
src="..."

Network resource

url="https://foo.com/bar.jpg"

→ Dynamic runtime instrumentation of page behavior.





PageGraph-enabled build of the Brave Browser

Script actor

id=789,

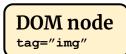
type="classic",

url="jQuery.js",

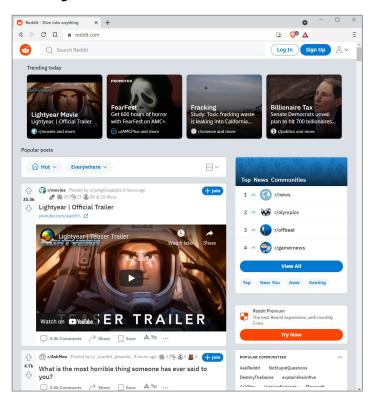
src="..."

Network resource

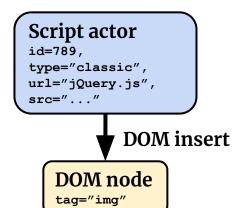
url="https://foo.com/bar.jpg"



→ Dynamic runtime instrumentation of page behavior.

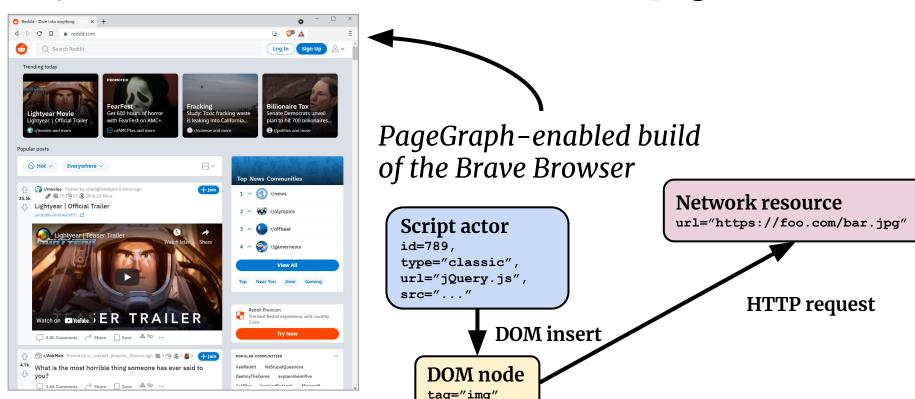


PageGraph-enabled build of the Brave Browser

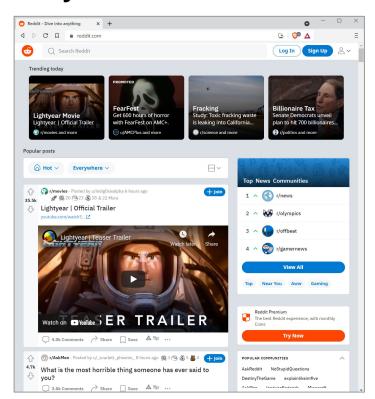


Network resource

url="https://foo.com/bar.jpg"

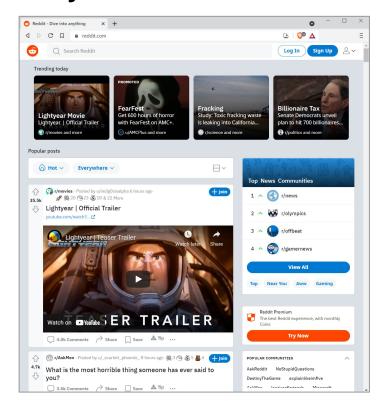


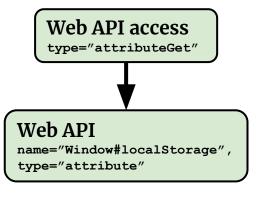
→ Dynamic runtime instrumentation of page behavior.

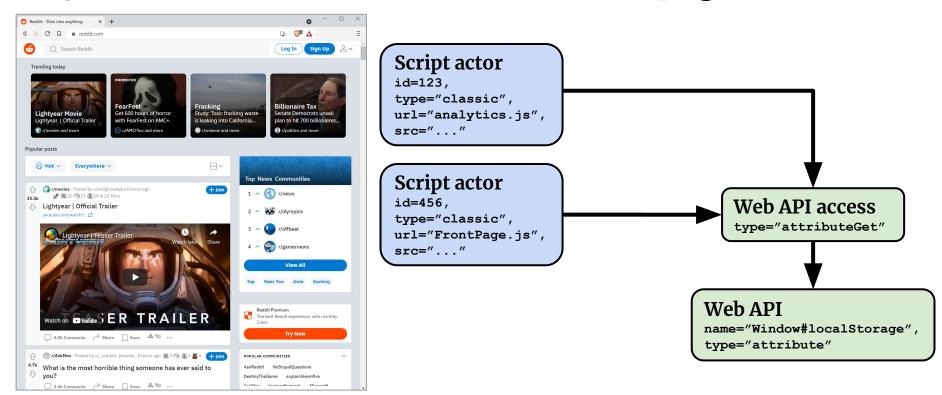


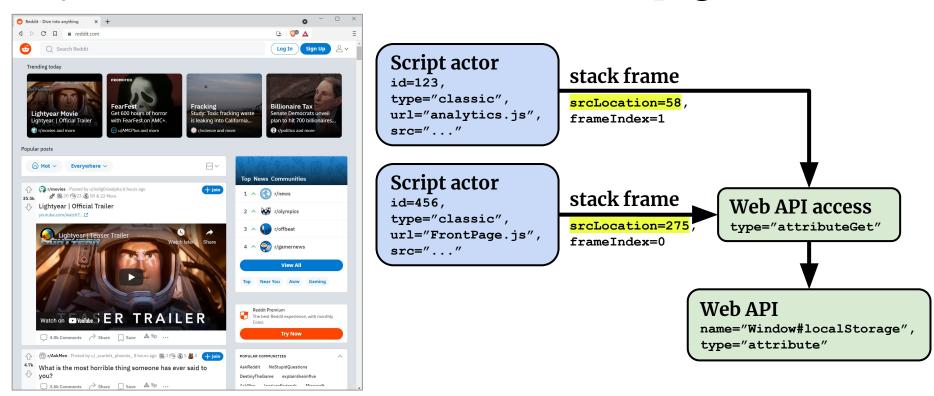
Web API

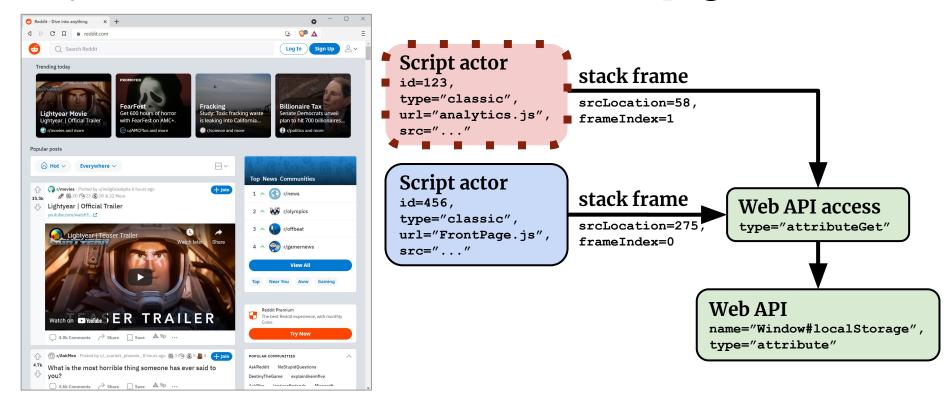
name="Window#localStorage",
type="attribute"

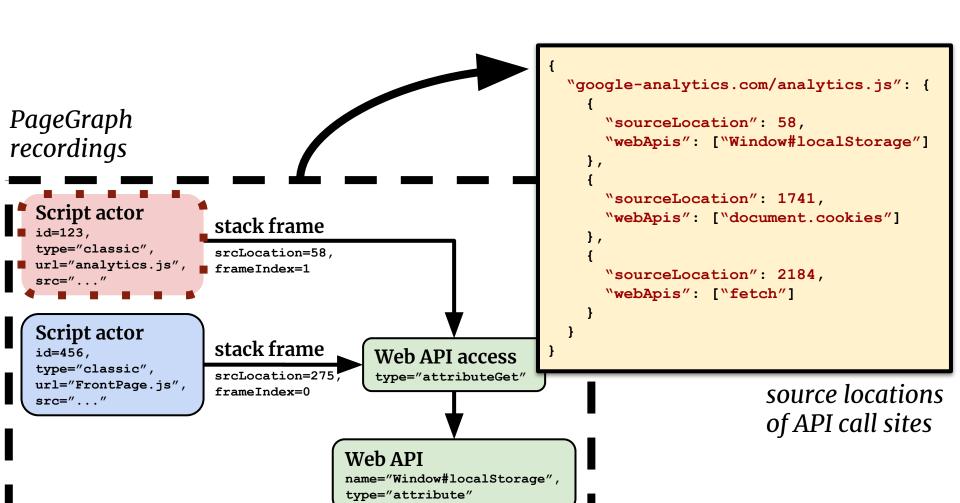


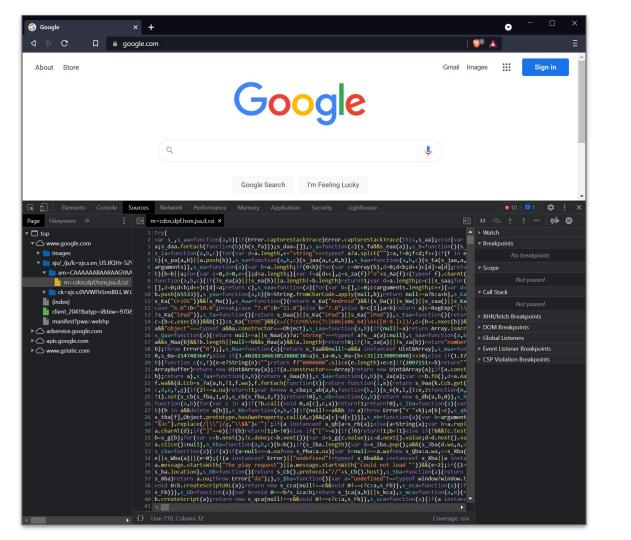












→ Ideally, we would do this statically!

- Q1: What parts of the scripts do we rewrite?
- Q2: What do we replace those script parts with?
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- Q1: What parts of the scripts do we rewrite?
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privacy-h arming script



- Document#cookies
- Window#fetch
- Window#localStorage

privacy-h arming script

```
APIs used:

Document#cookies

Window#fetch

Window#localStorage

$mockLocalStorage = ...;

privacy-h
arming
script
```

```
$mockFetch = ...;
                           $mockLocalStorage = ...;
APIs used:
                               privacy-h
   Document#cookies
                               arming
   Window#fetch
                               script
   Window#localStorage
```

```
$mockCookies = ...;
                               $mockFetch = ...;
                            $mockLocalStorage = ...;
APIs used:
                                privacy-h
   Document#cookies
                                arming
   Window#fetch
                                script
   Window#localStorage
```

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$mockCookies = ...;
                               $mockFetch = ...;
                            $mockLocalStorage = ...;
APIs used:
                                privacy-h
   Document#cookies
                                arming
   Window#fetch
                                script
   Window#localStorage
```

privacy-h arming script

```
function getTrackingId() {

    let trackingId = window.localStorage.getItem("trackingId");
    if (!trackingId) {
        trackingId = Math.random();
        window.localStorage.setItem("trackingId", trackingId);
    }
    return trackingId;
}
```

JavaScript Global Scope:

```
...
window.localStorage =
   /* browser-provided implementation */
...
```

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JavaScript Global Scope:

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window.localStorage =
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    }
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} finally {
    $restore(window, "localStorage");
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privacy-h arming script

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}
...
```

privacyrespecting resource replacement

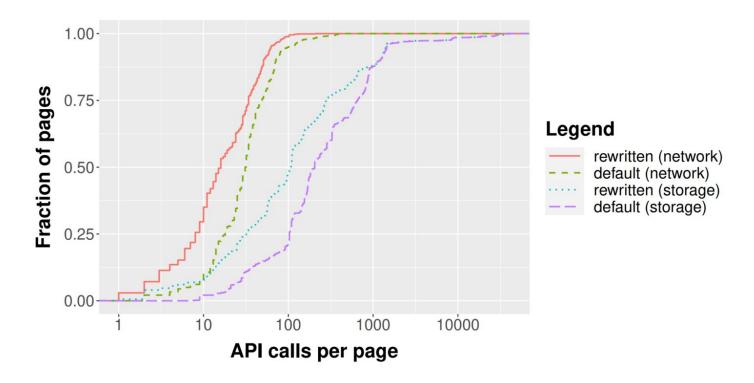
The rest of this talk...

- Q1: What parts of the scripts do we rewrite?
- Q2: What do we replace those script parts with?
- Q3: How do we locate those parts in script code?
- Q4: How do we actually transform script code?
- Q5: How do we know if it works?

Privacy Evaluation: Script-Level

	Original	Rewritten
# Storage Calls (Mean)	77	0
# Storage Calls (Median)	17	0
# Storage Calls (Total)	130,494	0
# Network Calls (Mean)	5	0
# Network Calls (Median)	0	0
# Network Calls (Total)	9,095	0

Privacy Evaluation: Page-Level



- **Compatibility Evaluation**
- **6** human evaluators
- **50** Web sites evaluated

(drawn from https://github.com/easylist/easylist/issues)

- 2 evaluators per site
- **3** conditions ("default", "blocked", "rewritten")
- 1 minute per site, per condition

Compatibility Evaluation

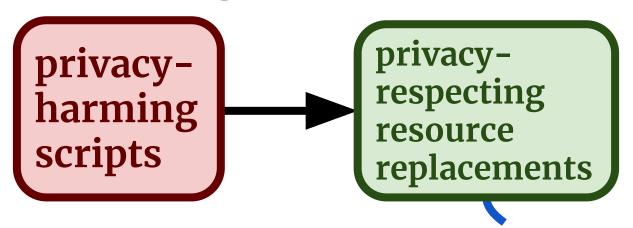
Rating Scale:

- $oldsymbol{1}$ no perceptible difference between the default and current conditions
- **2** browsing experience altered, but evaluator still able to perform the same tasks as in the default condition
- **3** evaluator not able to perform the same tasks as in the default condition

Compatibility Evaluation

Measure		
# evaluators		6
# Web sites evaluated		50
% agreement		90%
Measure	Mean	Median
When blocking	2.86	3
With SugarCoat	1.03	1

SugarCoat



already deployed in production!

<u>Summary</u>

- SugarCoat resources are shared and open
- Deployed in Brave today
- Used by 50m people daily
- UCSD <-> Brave collaboration

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