#### **Best-of-Breed Content Blocking in Brave:**

Three Projects to Improve the Depth, Breath, and Usefulness of Blocking at Scale

Pete Snyder Senior Privacy Researcher pes@brave.com @pes10k





- Grew up in Chicago ...actual Chicago
- Law school -> freelance web stuff
   Started: Anchorage, AK
   Ended: Judge Judy Show invitation
- PhD in Computer Science University of Illinois at Chicago



#### **Me at Brave**

- Researcher at Brave ... privacy, blocking, reliability
- **Co-Chair of PING** Privacy committee on W3C
- Research <-> Engineering Web compat, filter lists, fingerprinting, etc.



### **Brave in a Slide**

- Privacy focused
- Alternative web funding model Fix incentive problems
- Research + Engineering
- Browsers and infrastructure now, more to come...



#### **Overview**

• PageGraph

Novel, open source, DOM attribution system

- Behavioral Blocking
   Protecting Privacy Beyond URLs
- Regional Filter List Generation
   Privacy protection for users in underserved regions
- Automated Web Compatibility Testing Making sure we're only breaking bad stuff...

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Anton Lazarev - alazarev@brave.com Northeastern University

#### **PageGraph: Motivation**

- Lots of research requires understanding what script does what... Forensics, privacy, performance prediction, debugging...
- Seems simple...

Doesn't devtools do this already? Projects in research?

• Online and offline analysis Ordered, correct causal analysis

# **PageGraph: Challenges**

- Scripts
  - Script injects another script?
  - Inline scripts?
  - Script in HTML attributes? JS URLs?
  - Eval, new Function(), callback functions, micro tasks...
- Network
  - Attribution for injected images / videos
  - Fetch? Ajax? Remote frames?
- Web API use? Storage? DOM modifications? Etc...

#### **PageGraph: High Fidelity Cause Attribution**

#### Modification Cause Attribution

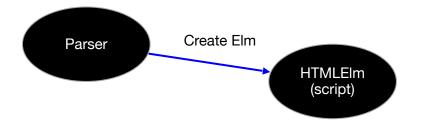
Record cause of all DOM modifications, network requests, privacy-relevant WebAPI calls

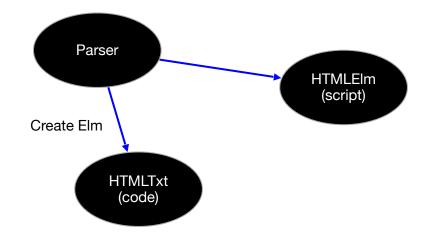
#### Graph Representation

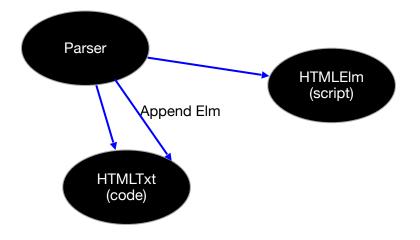
events -> edges, page elements -> nodes

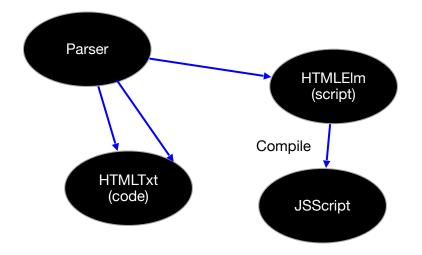
#### • Online and Offline Analysis In memory graph, GraphML Export

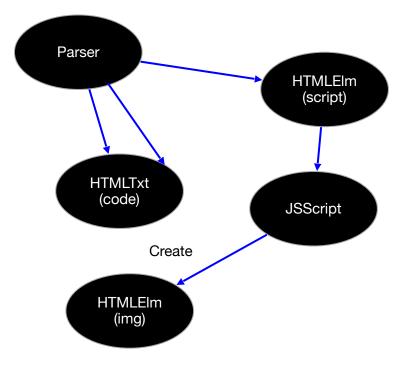
https://github.com/brave/brave-browser/wiki/PageGraph

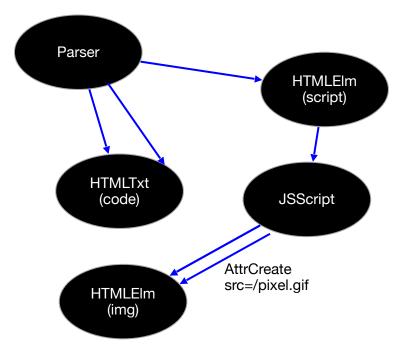


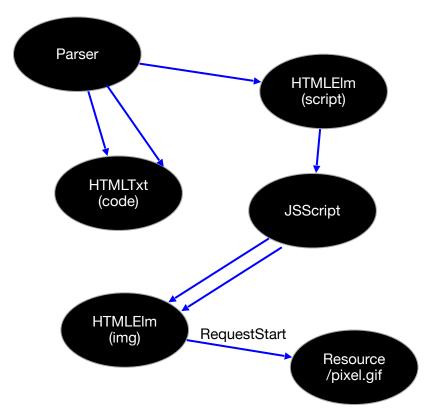


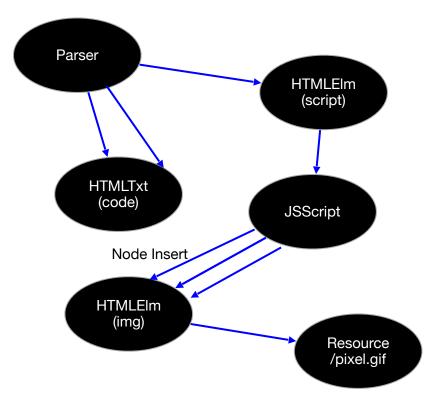


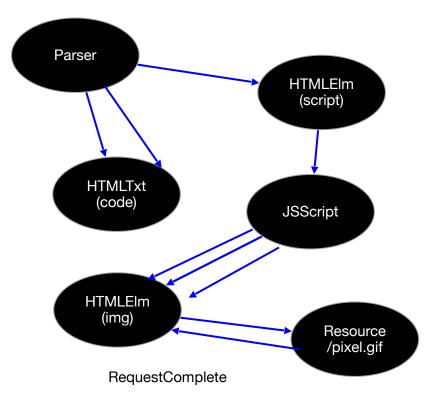


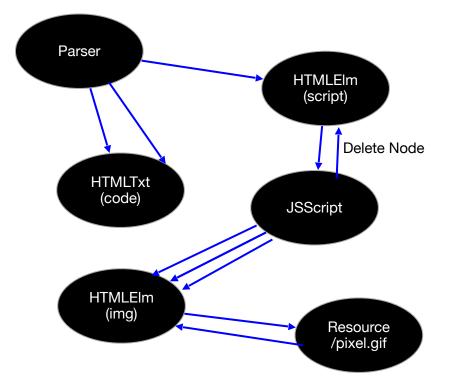




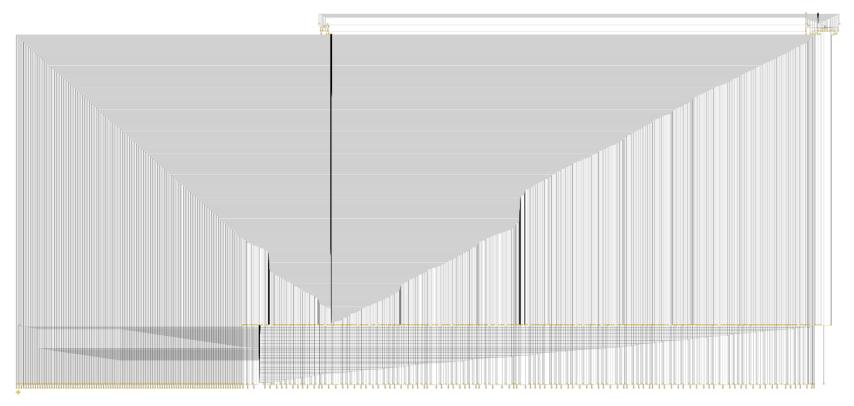








#### Fingerprint2.js example...



#### All of <u>CNN.com</u> (for 30 sec...)



#### Limitations

- Still stuff to instrument... e.g. Module scripts
- Bugs (but, few!) < 5% of pages will have an attribution error
- Dense graphs

Pages do a lot of things...

#### **PageGraph: Summary**

#### • Comprehensive causal attribution

Attribute every request, DOM modification, compilation and privacy event to responsible script

- In modern chromium based browser Up to date Brave, up to date Chromium
- Open source and For Use Now Build it today!

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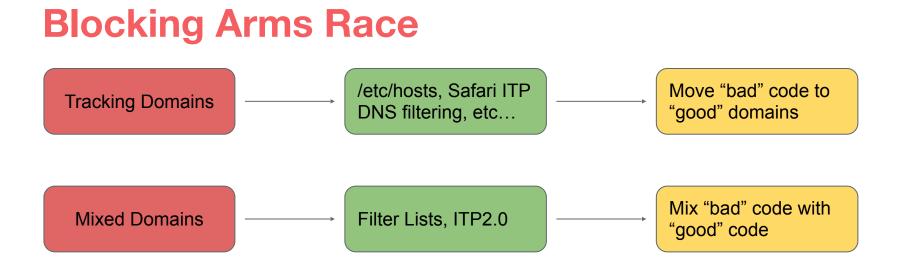


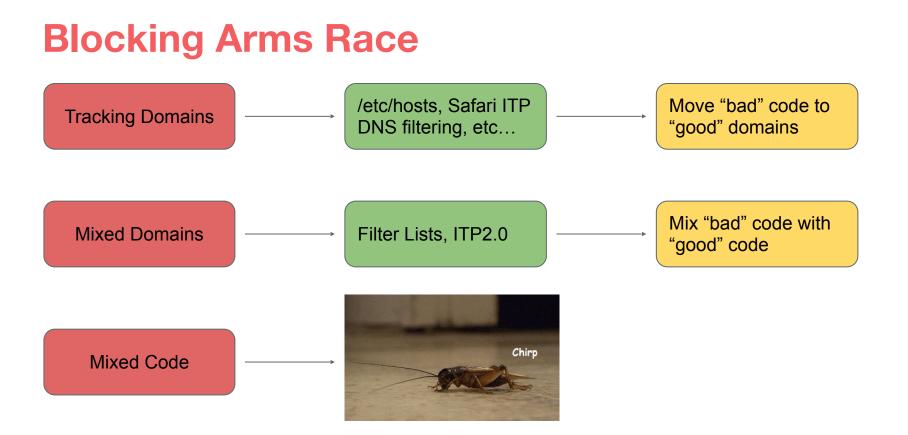
Quan Chen - <u>qchen10@ncsu.edu</u> North Carolina State University

#### **Blocking Arms Race**

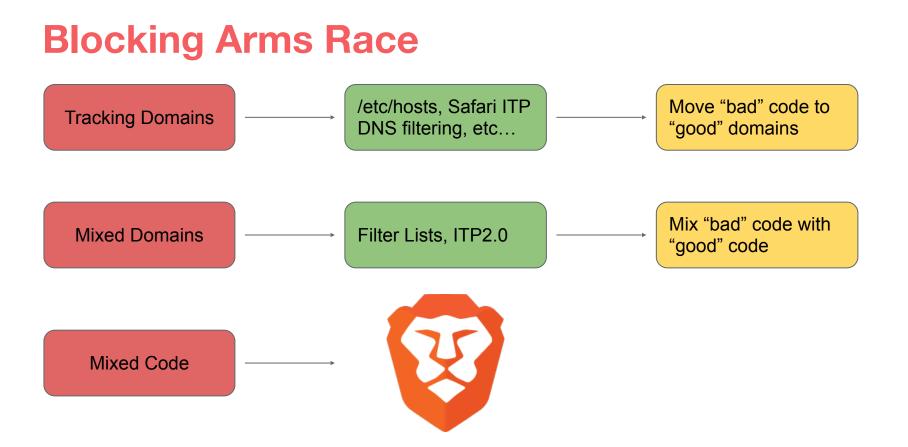
**Tracking Domains** 

/etc/hosts, Safari ITP DNS filtering, etc... Move "bad" code to "good" domains





#### 



#### **Behavioral Blocking Roadmap**

- 1. Motivation
- 2. Methodology
- 3. Results
- 4. Whats next

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#### **Motivating Example**

```
<html>
<head>
 <script src="(google-analytics.js)">
 <script src="(jQuery)">
 <script src="(Site stuff)">
</head>
<body>...</body>
</html>
```

#### **Motivating Example**

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</head>
<body>...</body>
</html>
```

#### **Motivating Example**

```
<html>
<head>
 <script src="(
   google-analytics.js + jQuery + site stuff
  ).min.js">
</head>
<body>...</body>
</html>
```

### **Motivating Example**

```
<html>
<head>
 <script src="(
   google-analytics.js + jQuery + site stuff
  ).min.js"> 乁_(ツ)_/
</head>
<body>...</body>
</html>
```

## **Core Problem: URLs**

- Moved code
- Changing URLs
- Inlining code
- Bundling code
- etc

## **Project Goals**

- Deliver the same privacy protections, independent of code delivery...
- Independent of URL...
- w/r/t Network requests, storage access, fingerprinting endpoints

<html>
<head>
<script src="(google-analytics.js)">
<script src="(jQuery)">
<script src="(jQuery)">
<script src="(Site stuff)">
</head>
<body>...</body>
</html>

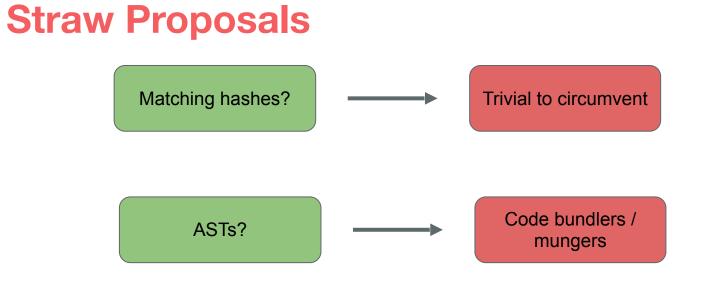
 $\equiv$ 

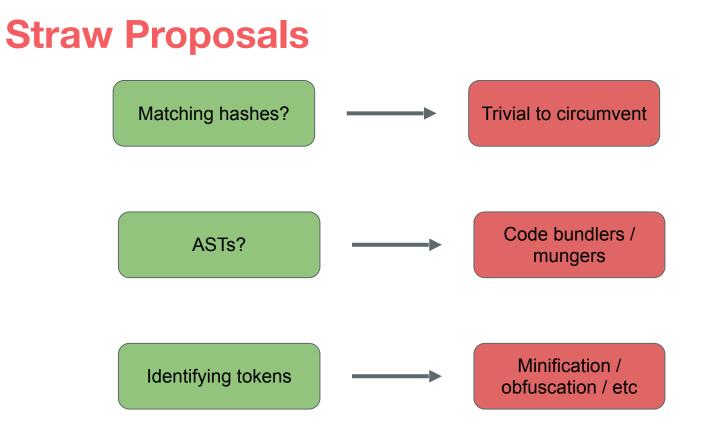
| <html></html>  |
|--|
| <head></head>  |
| <script src="(google-analytics.js +&lt;/td&gt;&lt;/tr&gt;&lt;tr&gt;&lt;td&gt;jQuery + site stuff).min.js"></td></tr><tr><td></head></td></tr><tr><td><body></body></td></tr><tr><td></html></td></tr></tbody></table></script> |

### **Straw Proposals**

Matching hashes?







## **Behavioral Blocking Roadmap**

- 1. Motivation
- 2. Methodology
- 3. Results
- 4. Deployment

## Methodology

- 1. Behavioral signatures of scripts Page graph, event loop turns
- 2. Build set of known privacy-harming behaviors EasyList + EasyPrivacy as ground truth
- **3. Check to see if new scripts do known bad things** e.g. apply extracted signatures

## **Signature Granularity**

### • Entire Script / Library?

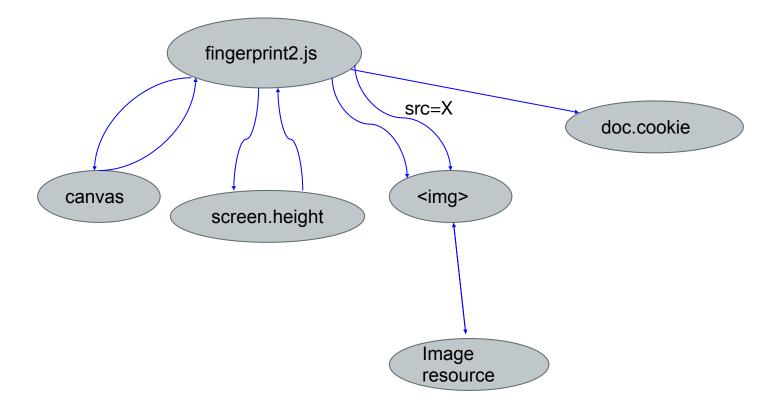
Too non-deterministic, too much variation between sites e.g. false negatives

### Individual API Calls? Not enough information e.g. false positives

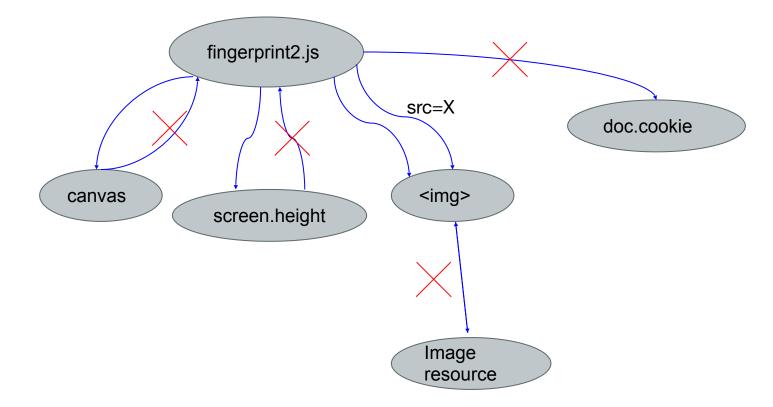
#### • Event Loop Turns

Good balance Allows some variation between library use

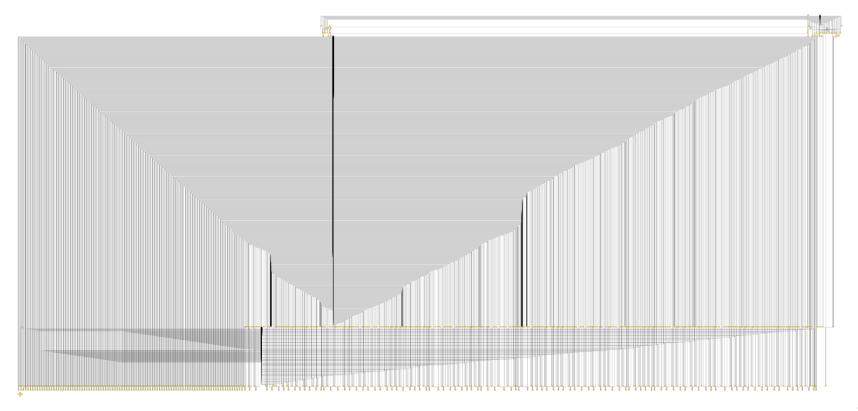
# Fingerprint2.js (e.g. bad)



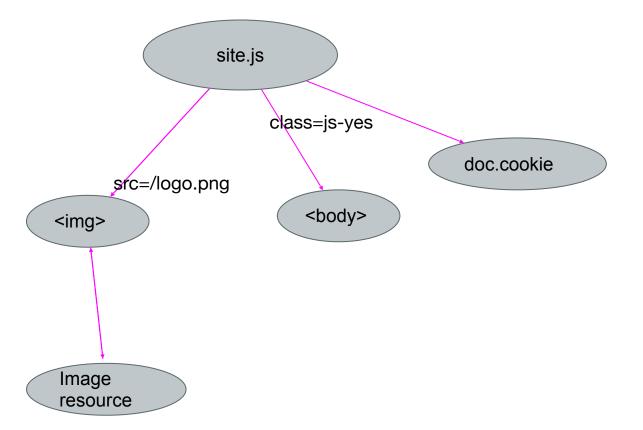
# Fingerprint2.js (e.g. bad)

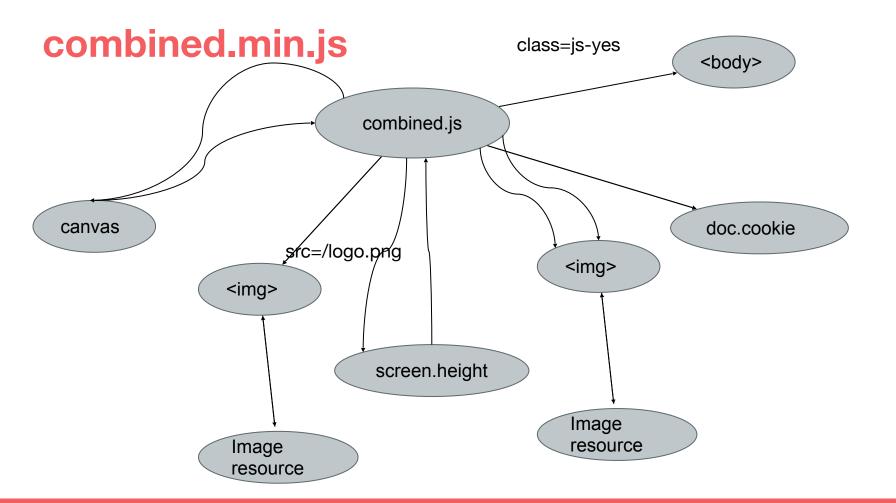


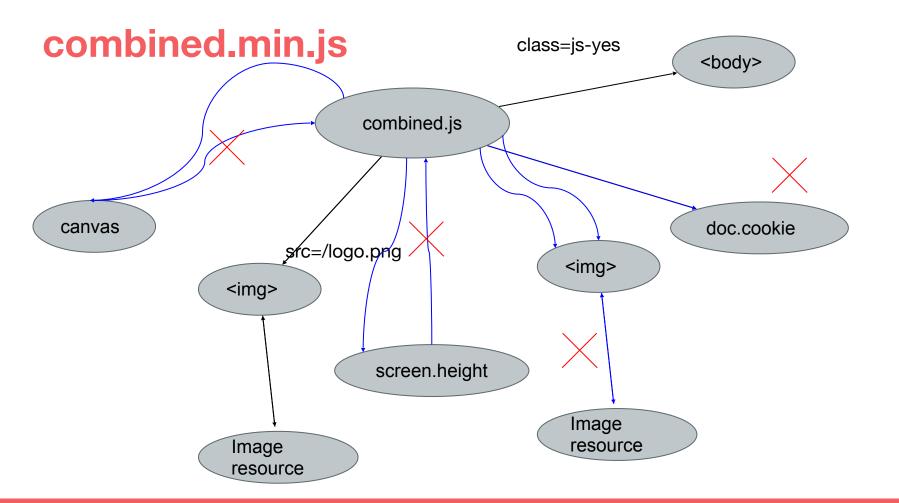
### **Obvious Fingerprint2.js is... obvious**



# site.js (e.g. benign)







## Putting it together...

- Catch script activities between event loop yields
- Graph represents as sequential edges and nodes
- Extract EL+EP subgraphs using the above algo
- Look for these recurring patterns in non-labeled JS units
- Enforce protections as if it came from original labeled script

## **Behavioral Blocking Roadmap**

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## **Raw data (partial)**

| Crawl set                           | Alexa 100k |
|-------------------------------------|------------|
| Generated signatures                | 1,996,093  |
| Privacy affecting, "bad" behaviors  | 400,287    |
| Num sites with >= 1 missed behavior | 11,443     |

# **Taxonomy: Moving Scripts**

- Moving script file from blocked code to new URL
- <u>https://example.org/tracker.js</u> -> <u>https://helpful.org/site.js</u>
- Long tail, hard to crowdsource, etc.
- 4,730 sites

## **Google Analytics**

- <u>https://www.google-analytics.com/analytics.js</u>
- Blocked by `||google-analytics.com/analytics.js`
- <u>https://messari.io</u> includes <u>https://messari.io/js/wutangtrack.js</u>

# **Google Analyt**

- https://www.google-ar
- Blocked by `||google-a
- https://messari.io inclu



# ÇÇÇÇÇÇÇÇÇÇÇÇ

## **Taxonomy: Inlining**

- Moving script from a URL to txt
- <script src="X"> to <script>(code)</script>
- Difficult for most tools to address at all
- Impossible for current tools to address well
- 223 sites

### **Dynatrace Example**

https://www.dynatrace.com/\*

(e.g. https://js-cdn.dynatrace.com/jstag/157944990f8/fsf84414/...)

- Blocked by `||dynatrace.com^\$third-party`
- But look at <u>https://www.dynatrace.com</u>...

## **Taxonomy: Bundling**

- Including harmful code with benign / user-serving code
- jQuery + fingerprint2.js + site.js -> combined.min.js
- No win choice for blockers...
- 122 sites

### **Microsoft Insights**

- E.g. https://az416426.vo.msecnd.net/scripts/a/ai.0.js
- Blocked by `||msecnd.net/scripts/a/ai.0.js`
- <u>https://lindex.com</u> -> <u>https://www.lindex.com/web-assets/js/</u> vendors.8035c13832ab6bb90a46.js

# **Taxonomy: Common Library**

- Third party libraries used by larger libraries
- Original library URL may never (rarely?) be fetched directly
- Not \*anything\* to block off
- 6,141 sites

## **Adobe Visitor API**

- Adobe has many tracking libraries (e.g. Adobe Target) that all use the Adobe Visitor API
- Visitor API is the tracking part
- Much is blocked with `||adobedtm.com^\$third-party`
- Other libs suck in Visitor API too
- E.g. <u>https://tags-eu.tiqcdn.com/utag/intel/profile-cq.emea/prod/utag.js</u>

| Technique   | # Instances | Unique Scripts |
|-------------|-------------|----------------|
| Moving      | 4,730       | 586            |
| Inlining    | 450         | 450            |
| Bundling    | 122         | 92             |
| Common Code | 6,141       | 2,342          |

## **Behavioral Blocking Roadmap**

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### What To Do Next

### • Defenses

Moved scripts -> new filter rules Others -> maybe runtime fingerprint enforcement?

### • Is the problem getting worse?

Longitudinal measurements (and WayBack Machine) Measurements going forward

### • Other places too

JS urls, HTML attributes, service workers, etc.

### Take Aways...

- Filter lists are porous
- Focusing on URLs is the problem
- Behavior >> delivery
- Brave has plans to protect users in a novel, more comprehensive way



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Alexander Sjösten - <u>sjosten@chalmers.se</u> Chalmers University of Technology

## Filter Lists, Unsung Heros...

### • Crowdsourced Lists

Network Rules: Requests Cosmetic Rules: Display Exceptions: Reverse the Above

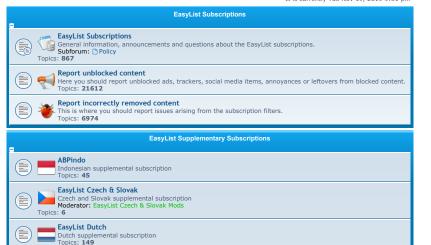
- EasyList: Blocks Ads 73,079 rules
- EasyPrivacy: Block Trackers 17,024 rules

# **Crowdsourcing Is Tricky**

| 11/19/2019                  | EasyList Forum - Board Index |                    |  |
|-----------------------------|------------------------------|--------------------|--|
| EasyList Forum              |                              |                    |  |
| E Quick links 🛛 FAQ 🖉 Rules |                              | 🕼 Register 🙂 Login |  |
| A Board Index               |                              | Q                  |  |
|                             |                              |                    |  |

Forum rules

It is currently Tue Nov 19, 2019 9:31 pm





## What About Everyone Else

- Regions with Fewer Speakers?
- Regions with Less Affluent Speakers?
- Less Internet Users?
- Higher Data Plans?
- etc...

- Image and Frame Classifier Heavy, offline, contextual
- Block High in Request Chain e.g. PageGraph to determine request causes

#### • Don't Break Pages

e.g. PageGraph to understand impact of blocking

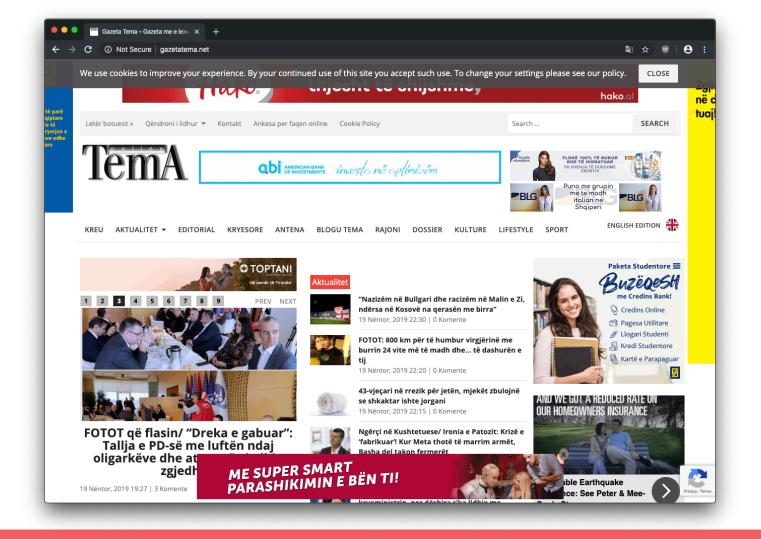
• Generate AdBlock Compatible Rules e.g. shippable and shareable

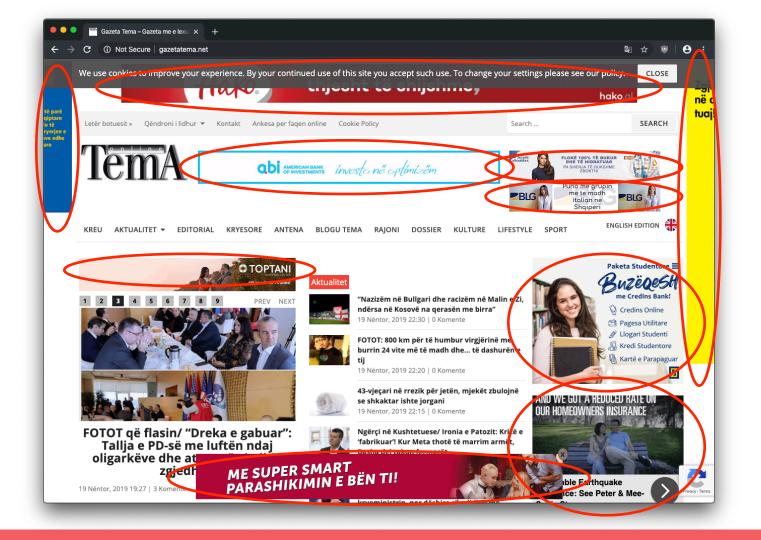
- Image and Frame Classifier
   Heavy, offline, contextual
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e.g. PageGraph to understand impact of blocking

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#### **Existing Work Doesn't Generalize**

|              | Accuracy | Precision | Recall |
|--------------|----------|-----------|--------|
| Trained Data | 95.9%    | 95.5%     | 96.4%  |
| New Data     | 77.0%    | 48.8%     | 87.4%  |

#### **Contextual Classifier**

#### • Existing Image Classifier

Tigas, Panagiotis, Samuel T. King, and Benjamin Livshits. "Percival: Making In-Browser Perceptual Ad Blocking Practical With Deep Learning."

PageGraph Contextual Information
 First or third party URL?
 Injected by script?
 Parent node degree?

#### **Context Helps a Lot...**

|              | Accuracy | Precision | Recall |
|--------------|----------|-----------|--------|
| Trained Data | 95.9%    | 95.5%     | 96.4%  |
| New Data     | 77.0%    | 48.8%     | 87.4%  |
| Contextual   | 97.6%    | 92.0%     | 75.0%  |

- Image and Frame Classifier Heavy, offline, contextual
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   e.g. PageGraph to determine request causes

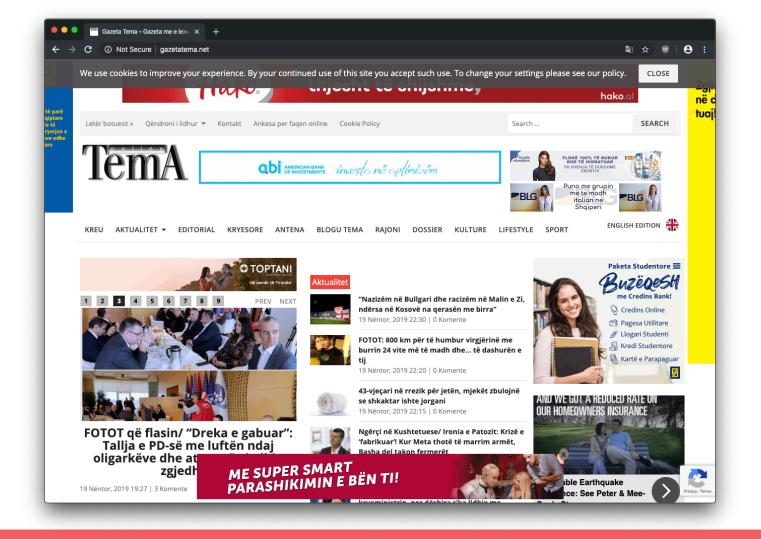
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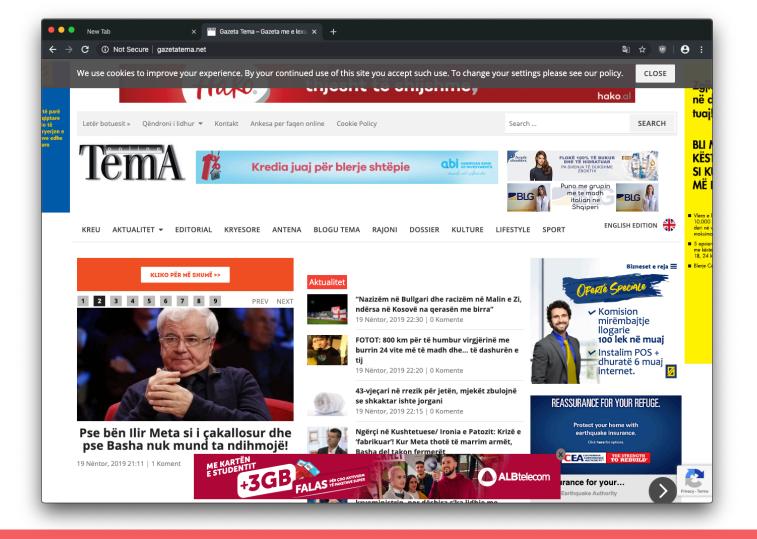
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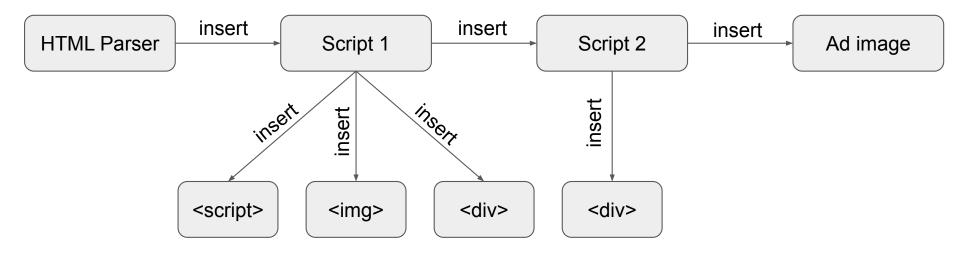
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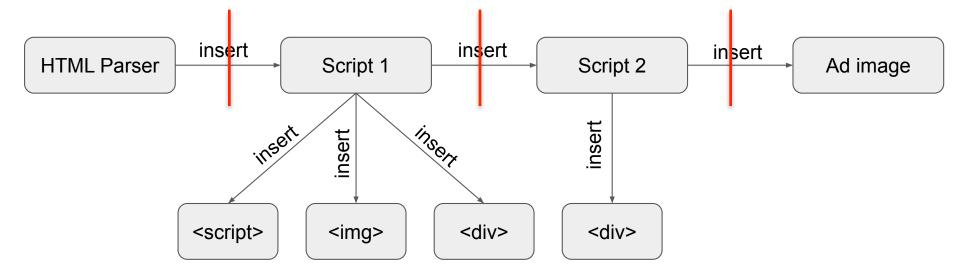
### Ads Aren't (Usually) Static URLs

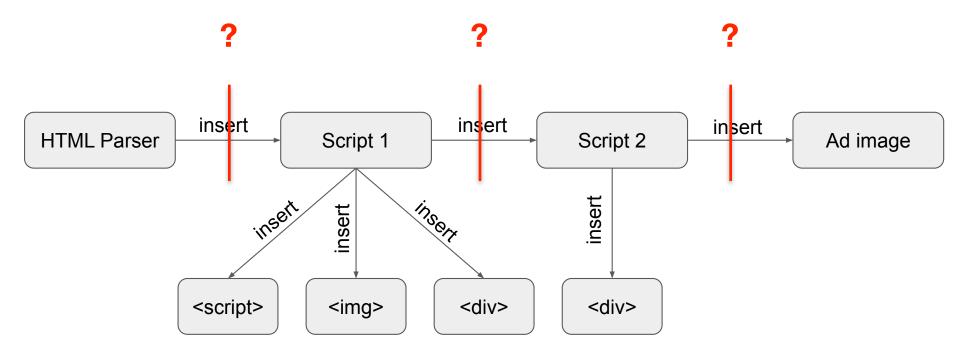
- Programmatically Inserted Scripts
- Real Time Bidding
- Header Bidding
- Targeting Final URLs -> Stale Rules











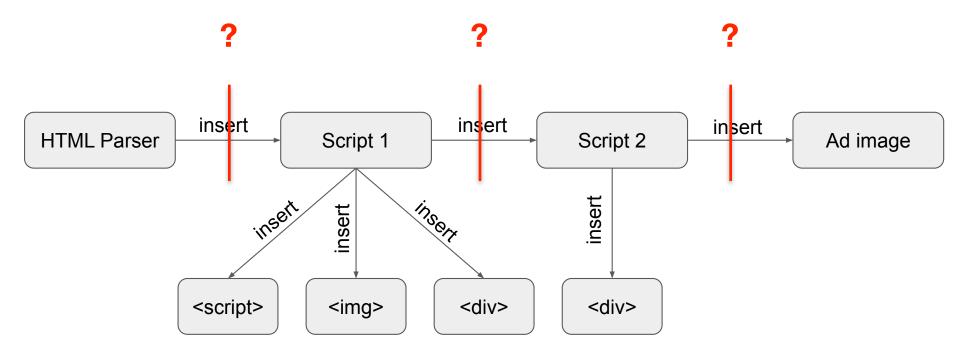
- Image and Frame Classifier Heavy, offline, contextual
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e.g. PageGraph to understand impact of blocking

Generate AdBlock Compatible Rules

e.g. shippable and shareable



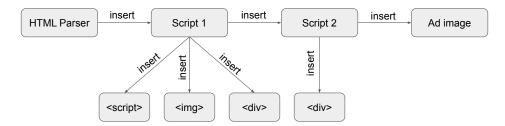
## Where to Safely Cut?

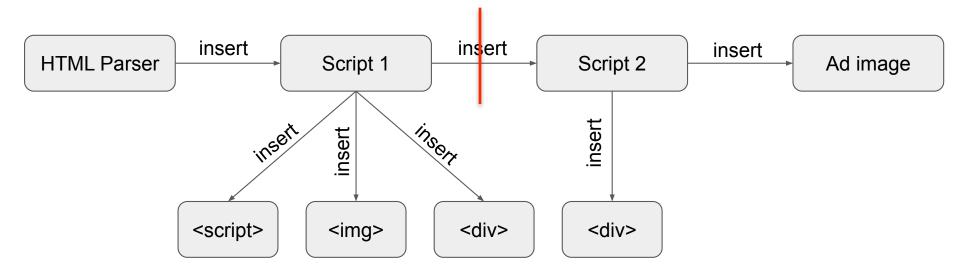
1.Start with identified ad...

2.If a script creates more then two subtrees in the document, **stop** 

3.If script inserts a script that that does #2, **stop** 

4.Otherwise, **block** and continue up





- Image and Frame Classifier Heavy, offline, contextual
- Block High in Request Chain e.g. PageGraph to determine request causes
- Don't Break Pages

e.g. PageGraph to understand impact of blocking

Generate AdBlock Compatible Rules
 e.g. shippable and shareable

#### URLs → Filter Rules

1. Take URL

2. Reduce to eTLD+1

1. https://a.good.example.com/ ad.html#banner?id=3

2. https://example.com/ ad.html#banner?id=3

3. Remove query params and fragment

4. Remove protocol

3. https://example.com/ad.html

4. ||example.com/ad.html

| Country   | Current Lists | Classifier | ∪ Chains | Δ     |
|-----------|---------------|------------|----------|-------|
| Albania   | 3,021         | 451        | 521      | 17.2% |
| Hungary   | 2,619         | 549        | 736      | 28.1% |
| Sri Lanka | 2,204         | 512        | 644      | 29.2% |
| Total     | 7,844         | 1,512      | 1,901    | 24.2% |

#### Take Aways...

- Filter lists are good (if not great)
- Right now they fail folks who need the most
- ML + serious consideration can help
- Brave will be shipping soon



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   Making sure we're only breaking bad stuff...





Michael Smith - mds009@ucsd.edu University of California at San Diego

#### Automated WebCompat: In A Slide...

- Brave makes aggressive modifications And not just Brave...
- We're Flying Blind

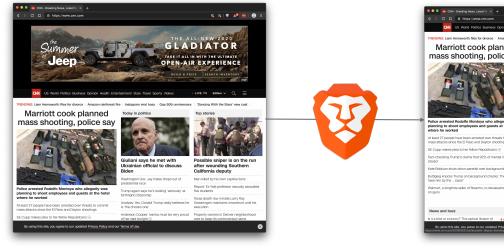
Privacy community only has vague intuitions if / when we're breaking things

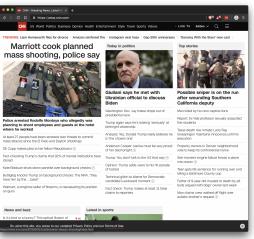
#### • This Hurts Privacy

Uncertainty -> risk averseness, hard to iterate to improvements

#### • This Makes People Want Other Problems

Brenden's Twitter blows up, I work late, my plants die 😥







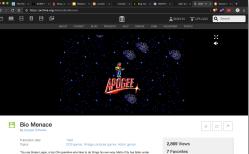












1 Review

DOWNLOAD OPTIONS

You are solved upper (a stop U-collection who leads to coll insight in sum rate, merror curry rate later touble the stable of following the market and your insight is to its first out on the top's and report baseling. While collecting over the objective stable of the stable bases and foread to cambiand on the attends of Males. Stability which applies yoursen they out are cut to discover the scores of these realisms and espectably the pay who shot you down!

Intelligence reports indicate that a man calling himself Dr. Mangle is responsible for the mutants and the destruction of Metro. You will have to battle your way through many levels packed with evil mutants and

#### WebCompat Problem Cavalcade

- Missing desired images
- Missing / broken event registrations
- Media playback
- Navigation problems
- Unstyled content

- Authentication
- Broken redirections
- Missing embedded content
- Form submissions
- Etc etc etc etc (etc!)

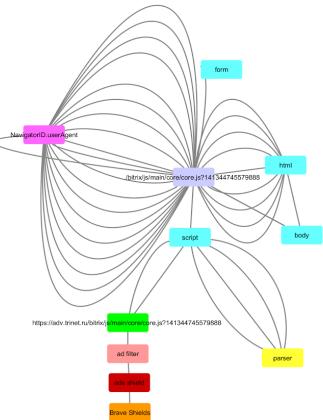
#### What Makes Web Compat Difficult

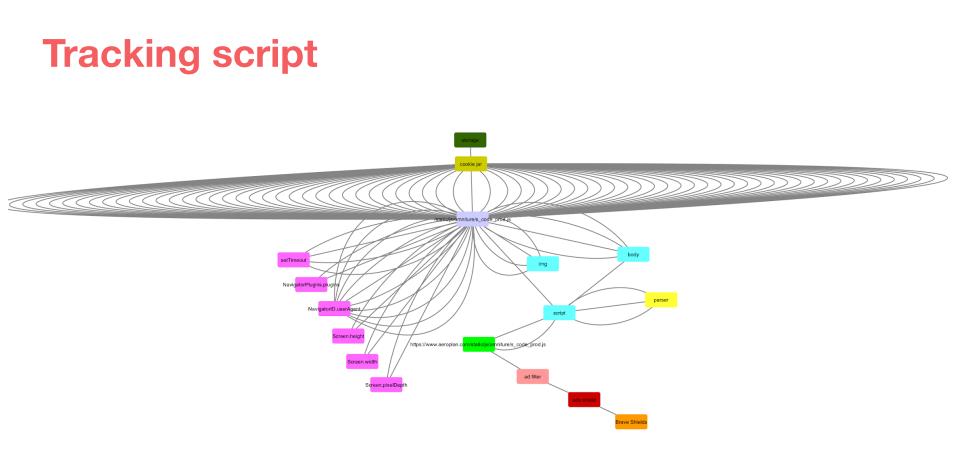
- Existing work focuses on fulfilling promises to site owners
  - Web Platform Tests: <u>https://github.com/web-platform-tests/wpt</u>
  - WebCompat.org: <u>https://webcompat.com/</u>
  - etc...
- We want to measure subjective user experience
  - "If I break standard X, will users get upset"
- Limited existing work
  - Academic work is useful but naive
  - Remaining, subjective work has to do with accessibility

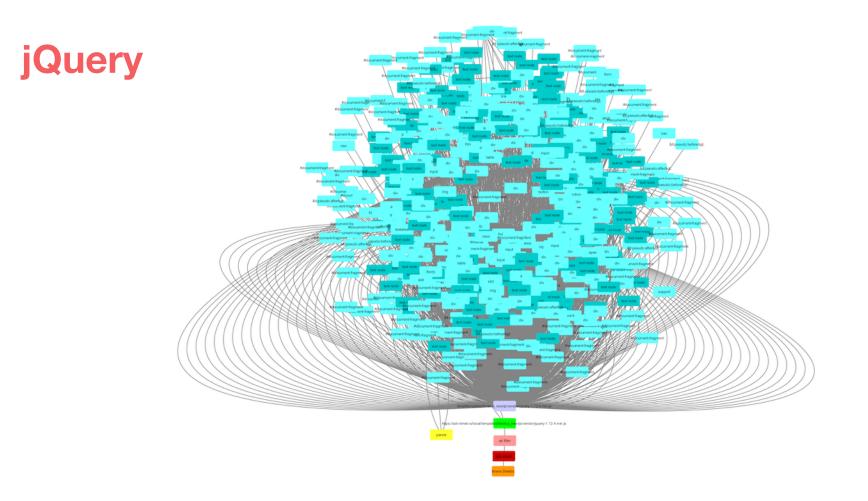
## **Bounding the Problem (First Cut)**

- Recall > Precision
- Top level frame and local frames
- Target things that are broken from the get go

### **Random script**







#### Take Aways...

- Privacy community is drowning in suggestions
- We ignore half the ledger
- Useable privacy -> More privacy



# Wrapping Up

• PageGraph

Novel, open source, DOM attribution system

- Behavioral Blocking
   Protecting Privacy Beyond URLs
- Regional Filter List Generation
   Privacy protection for users in underserved regions
- Automated Web Compatibility Testing Making sure we're only breaking bad stuff...

#### **Internships**

• Research focused

Papers published at S&P, WWW, USENIX, MADWeb, etc.

#### • Engineering focused

Shipping features to related to measurement, improved blocking, detection, and more

• San Francisco and London offices https://brave.com/careers/?gh\_jid=896018

# Thank You

- Brave is Uniquely Doing Deployment-Minded Privacy Research
- Short Term: Better Regional Filter Lists
- Medium Term: Behavioral Based Blocking
- Long(ish) Term: Automatic WebCompat



Pete Snyder Privacy Researcher pes@brave.com @pes10k