

# Browser fingerprinting

(how did we get here)

**SecAppDev**

February 2014

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[www.securitee.org](http://www.securitee.org)



# echo `whoami`

- Postdoctoral researcher at KU Leuven
- Working, mainly, on web security and privacy
- Identify online ecosystems
  - Players
  - Interactions
  - Common patterns
- Search for systematic problems and solutions

# 1993

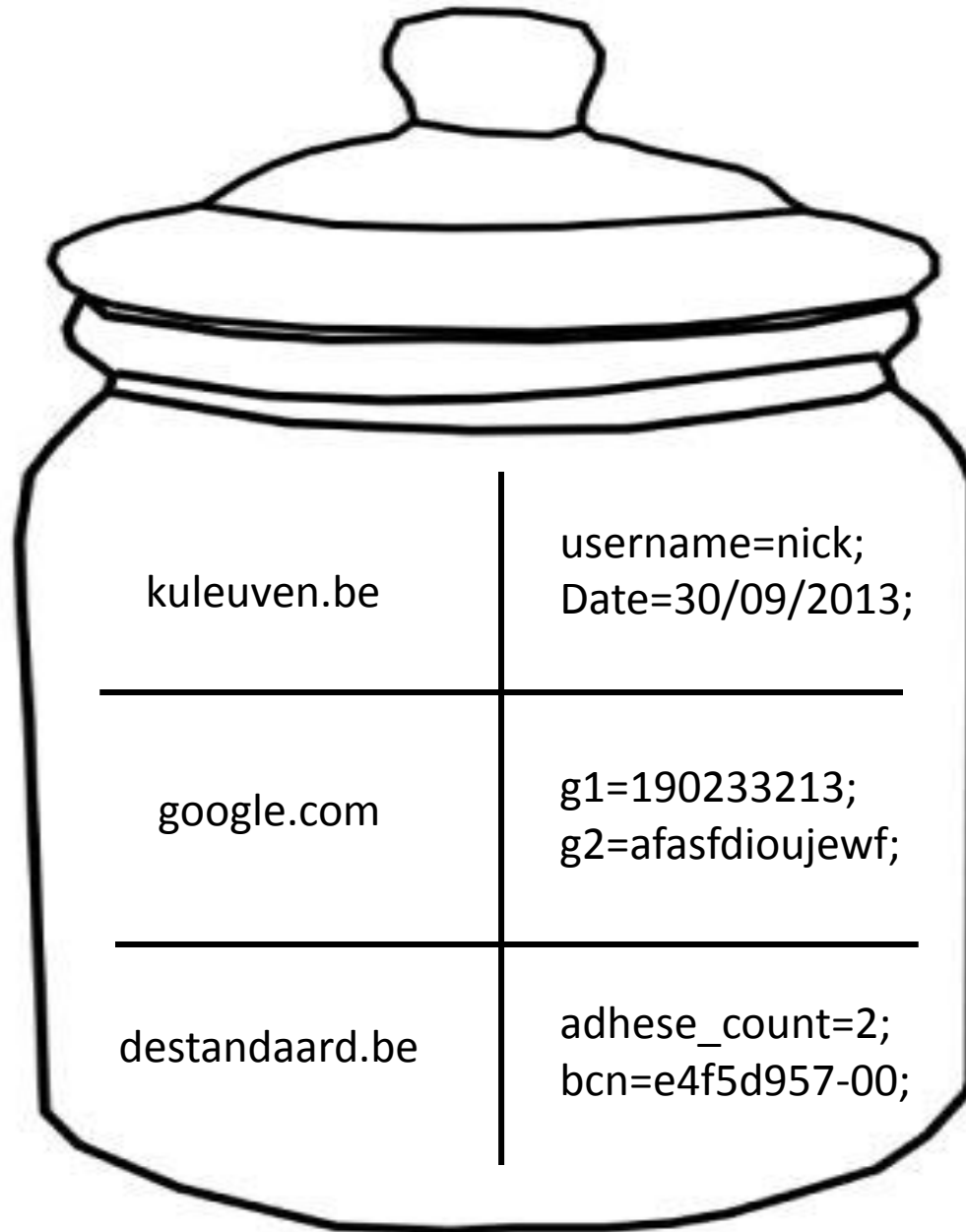


*"On the Internet, nobody knows you're a dog."*

# I need state!

- HTTP is a stateless protocol
  - The server does not know that two or requests originate from the same user
- No state -> No Personalization
  - No e-banking, e-shops, webmail, etc.
- Solution: Cookies!





|                |                                     |
|----------------|-------------------------------------|
| kuleuven.be    | username=nick;<br>Date=30/09/2013;  |
| google.com     | g1=190233213;<br>g2=afasfdioujewf;  |
| destandaard.be | adhese_count=2;<br>bcn=e4f5d957-00; |

**60% korting**

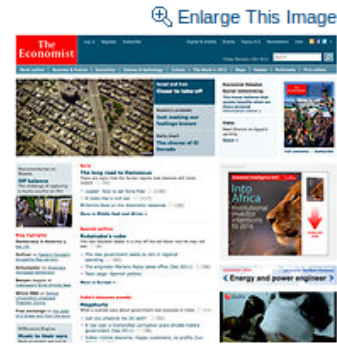
» **Klik hier**

Advertise on NYTimes.com

### Study Finds News Sites Fail to Aim Ads at Users

By TANZINA VEGA  
Published: February 13, 2012

Web sites for newspapers, magazines and television stations might be hungry to make money with digital advertising, but you wouldn't know it by the way some of them do business online.



The Economist's home page is not unusual in displaying ads for the company's products.

A new study released Monday by the Pew Research Center Project for Excellence in Journalism looked at 22 news Web sites and more than 5,300 digital ads. It found that many of the sites had not attracted the same advertisers online as they did on other platforms.

In part, these sites were failing to attract online ads because they were not using technology that would customize ads based on their users' online behavior. For example, a user searching for tickets to a Broadway show might see ads for that show.

The study, which looked at Web sites for 11 newspapers, four magazines and six television outlets, as well as two online-only sites, focused on premium digital ad placements on home pages or at the top of article pages, which have generally cost more to buy.

"One of the great challenges that faces the financial future of journalism is, how can you begin to charge more for digital advertising?" said Tom Rosenstiel, the director of the center. "The

- RECOMMEND
- TWITTER
- LINKEDIN
- SIGN IN TO E-MAIL
- PRINT
- REPRINTS
- SHARE

Log in to see what your friends are sharing on nytimes.com. Log In With Facebook  
[Privacy Policy](#) | [What's This?](#)

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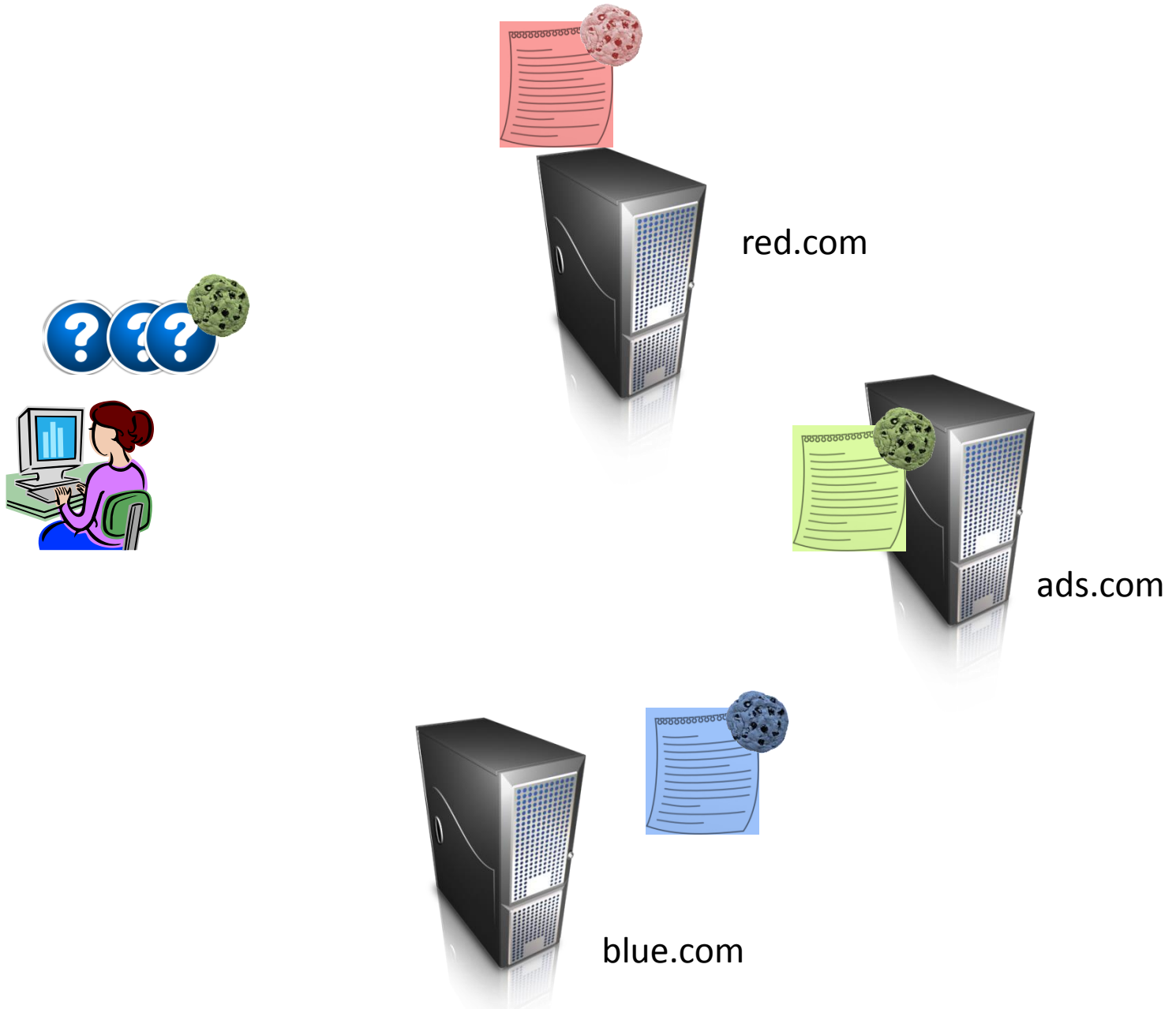
TRADING 212

**DAS GOLD FÜR SICH ARBEITEN LASSEN**

**GRATIS 10 000 € DEMO »**

Advertise on NYTimes.com

# A cookie's life





# 3<sup>rd</sup> Party Tracking

- “Suddenly” all sorts of websites that you’ve never heard about, can create a browsing profile of you and sell it to advertising companies
  - [quantserve.com](http://quantserve.com)
  - [scorecardresearch.com](http://scorecardresearch.com)
  - [addthis.com](http://addthis.com)





# Users reacted...

- 1/3 of users delete first & third-party cookies within a month after they've been setup
- Multiple extensions revealing hidden trackers
  - Ghostery
  - Lightbeam
- Private mode of browsers used to avoid traces of cookies from certain websites

# Ghostery

www.washingtonpost.com

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## The Washington Post

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Paul Kane and Robert Costa

Unless Republicans quickly unite around a plan for the debt ceiling, the last week of February will bring another countdown moment before a critical fiscal deadline.

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Jerry Markon and Alice Crites

EXCLUSIVE | Accenture has been criticized for its performance and ethics



The Redskins' name has faced intense scrutiny. (Jonathan Newton/Post)

### Lawmakers pressure NFL on Redskins

ADVERTISING

Yoleen wil dat niemand in de kou blijft staan. En jij?

lees waarom

Ontdek onze 25 verbintenissen

Verandering Voor Vooruitgang

NVA DENKEN.DURVEN.DOEN.

Ghostery found 48 trackers  
www.washingtonpost.com

- Acxiom Advertising
- Adap.tv Advertising
- AddThis Widgets
- Adobe Test & Target Beacons
- Adroit Digital Solutions Advertising
- AdScale Advertising

Pause Blocking Whitelist Site ?

# Lightbeam

DATA GATHERED SINCE

FEB 10, 2014

YOU HAVE VISITED

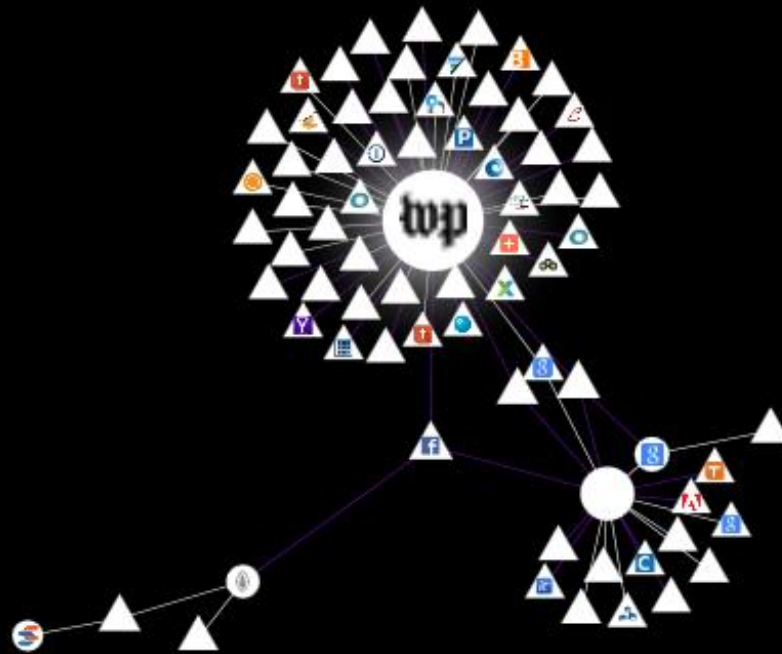
5 SITES

YOU HAVE CONNECTED WITH

73 THIRD PARTY SITES

Daily

GRAPH VIEW



# EU Cookie law

“Member States shall ensure that the storing of information, or the gaining of access to information already stored, in the terminal equipment of a subscriber or user is only allowed on condition that the subscriber or user concerned has given his or her consent, having been provided with clear and comprehensive information, in accordance with Directive 95/46/EC, inter alia, about the purposes of the processing. This shall not prevent any technical storage or access for the sole purpose of carrying out the transmission of a communication over an electronic communications network, or as strictly necessary in order for the provider of an information society service explicitly requested by the subscriber or user to provide the service.”

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The Register uses cookies. Some may have been set already. [Read about managing our cookies.](#)  
Please click the button to accept our cookies. If you continue to use the site, we'll assume you're happy to accept the cookies anyway.



Cookies helpen ons bij het leveren van onze diensten. Door gebruik te maken van onze diensten, gaat u akkoord met ons gebruik van cookies. [OK](#) [Meer informatie](#)

## Care for a cookie or two?



Here at Bluehost, we want you to have the most relevant customer experience possible. That's why we use cookies – they help remember log-ins and optimize the content you see based on your interests and preferences.

AGREE AND PROCEED

[Find out more about the cookies we use on this website »](#)

# Belgium?

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Zoeken naar...



Ghostery found 5 trackers  
www.laptopshop.be



**laptopshop.be**



Voor 23.59 uur besteld, morgen **gratis** bezorgd



2 échte winkels



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CAMPUSSEN

Informatie voor

Toekomstige student

Student

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ALL



Ghostery found 2 trackers  
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Facebook Social Plugins  
Widgets



Google Analytics  
Analytics





MOST EUROPEAN

of information,  
y stored, in the  
only allowed on

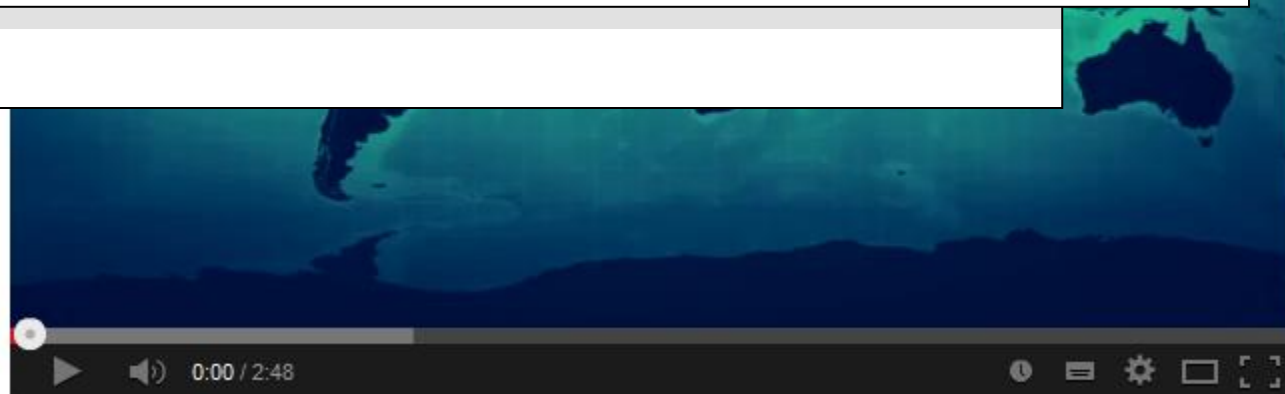
**WIRED.CO.UK**

FOLLO

NEWS ▾ Topics / TECHNOLOGY COOKIES EU EUROPEAN UNION

# Compliance with EU cookie law could cost the UK £10 billion

com  
or as  
information societ  
subscriber or user



The stupid EU cookie law (and why it should die)



# Money making



The screenshot displays the website for The Cookie Collective, a company focused on data trust. The main navigation bar includes links for 'Find Trusted Sites', 'Events', and 'Blog'. A secondary navigation bar lists 'Industry Solutions', 'Business Products', 'Business Resources', and 'Consumer Resources'. The featured product is the 'TRUSTed Consent Manager', which is described as a solution for helping brands comply with the EU Cookie Directive and build consumer trust. The background of the product banner features a binary code pattern and a silhouette of the London skyline, including Big Ben and the London Eye, with a map of Europe overlaid.

**The Cookie Collective**

**TRUSTe** POWERING TRUST IN THE DATA ECONOMY

[Find Trusted Sites](#) | [Events](#) | [Blog](#)

[Industry Solutions](#) [Business Products](#) [Business Resources](#) [Consumer Resources](#)

## TRUSTed Consent Manager

Home > Products & Services > TRUSTed Consent Manager

### TRUSTed Consent Manager

Helping Brands to Easily Comply with the EU Cookie Directive and Build Consumer Trust



= PROBLEM



=



Right?

# However...

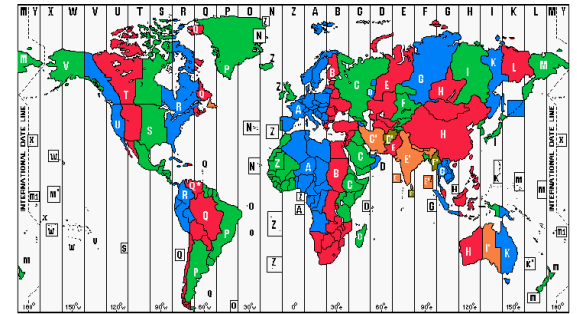
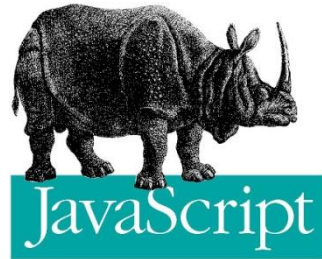


- What if you could track users without the need of cookies or any other stateful client-side identifier?
  - Hidden from users
  - Hard to avoid it / opt-out

## **Web-based device fingerprinting**

- Eckersley showed in 2010 that certain attributes of your browsing environment can be used to accurately track you
- These attributes, when combined, created a quite unique fingerprint of your system?
  - How?

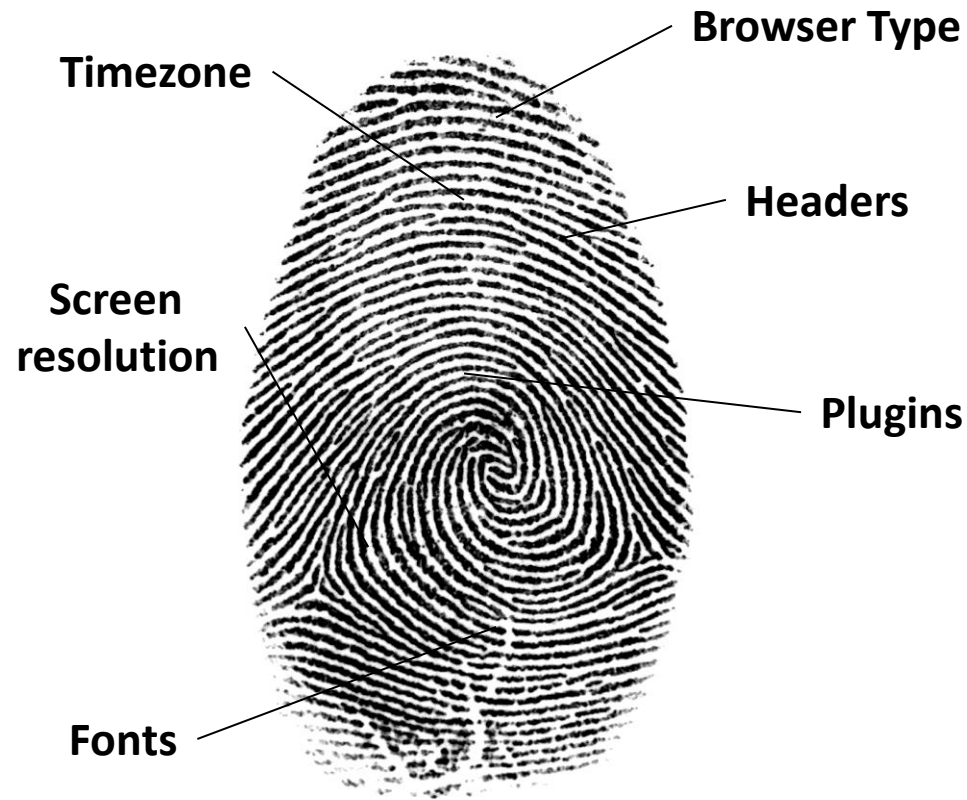
# Properties fingerprinted by Panopticlick



*Maverick*  
Ocean Front Villas  
Mandarin Sea  
**Regency**  
Sassafras & Ginger  
Dollhouse  
Athletics Dept.



# Resulting fingerprints



- 94.2% of the users with Flash/Java could be uniquely identified
- Simple heuristic algorithms could track updates of the same browser

# Other proposed ways

- Eckersley paved the way of stateless tracking through fingerprinting
- After Eckersley, other researchers proposed ways of fingerprinting browsers, based on:
  - Speed
  - Implementation coverage
  - Rendering of elements



# They will know you by your speed...

- Mowery et al. (W2SP 2011) proposed the use of performance benchmarks to tell different JavaScript engines apart
  - Different JavaScript engine -> Different browser
- Collected performance signatures (39 tests) from approx. 1000 users
  - 98.2% correct browser family detection
  - Overall accuracy (versions included): 79.8%



What are we?!



Browsers!



Browsers!



Browsers!



What do we want?!



More speed!



More speed!



More speed!



And when do we want it?!



Right now!



Right now!



Right now!



Browsers!



# As well as your features...

- Mulazzani et al. (W2SP 2013) proposed the use of missing functionality in JavaScript engines
  - Different browsers, implement JavaScript standards, at a different rate

| <b>Browser</b> | <b>Win 7</b> | <b>WinXP</b> | <b>Mac OS X</b> |
|----------------|--------------|--------------|-----------------|
| Firefox 3.6.26 | 3955         | 3955         | 3955            |
| Firefox 4      | 290          | 290          | 290             |
| Firefox 5      | 264          | 264          | 264             |
| Firefox 6      | 214          | 214          | 214             |
| Firefox 7      | 190          | 190          | 190             |



# As well as your artistic talent

- Mowery et al. (W2SP) proposed the use of the HTML5 canvas to detect browser-specific renderings of the same string
  - Write some text in canvas, read it out as an image
  - Different browsers/hardware combinations will create slightly different images
  - <http://jsbin.com/ePAheCi/2/edit>





# ADS

Pa

## Feds Are Suspects in New Malware That Attacks Tor Anonymity

BY KEVIN POULSEN 08.05.13 3:57 AM

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# EU Cookie law

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**Does it apply to fingerprinting?**

# What's happening out there?

- In mid 2012, all we knew is that fingerprinting is possible and that a small number of companies offer it as a service
- Questions that begged answering:
  - How are they doing it?
  - Could they do more?
  - Who is using them?
  - How are users trying to hide?
    - Is it working?

# Manual analysis of 3 fingerprinting companies



1. Find the domains that they use to serve their fingerprinting scripts
2. Find some websites that use them and extract the code
3. De-obfuscate and analyze
4. Compare and classify



```
return;}var _i_b=_i_aa.getElementById(window.io_about_element_id);_i_b["value"]=_if_fa;}func
window.io_bb_callback:__if_d;_i_c(_if_fa,_if_fb);}var _i_d={__if_p:function(_if_fc){return _if
(_if_fc.getUTCDate(),2)+" "+this.__if_ad(_if_fc.getUTCHours(),2)+":"+this.__if_ad(_if_fc.get
__if_e=_if_fd.toString(16);return(_i_m)?this.__if_ad(_i_e,_i_m):_i_e;},__if_u:function(_i_bz)
odeAt(_i_g);if(_i_h>=56320&&_i_h<57344)continue;if(_i_h>=55296&&_i_h<56320){if(_i_g+1>=_i_bz
nue;_i_h=((_i_h-55296)<<10)+(s-56320)+65536;}if(_i_h<128)_i_f+=String.fromCharCode(_i_h);els
_f+=String.fromCharCode(224+((_i_h>>12),128+((_i_h>>6)&63),128+(_i_h&63));else _i_f+=String.fr
rn _i_f;},__if_y:function(_if_fe){if(typeof(encodeURIComponent)=="function")return encodeURI
length;_i_g++){var _i_k=_i_j.charAt(_i_g);var _i_l=new RegExp("[a-zA-Z0-9-_.!~*'()]");_i_f+=
function(_i_bz,_if_ff){var _i_m="";var _i_n=_if_ff-_i_bz.length;while(_i_m.length<_i_n)_i_m+="
JKLMNOPQRSTUVWXYZabcdefghijklmnopqrstuvwxyz0123456789+/",__if_aj:function(_i_bz){var _i_e="
_i_bz.charCodeAtAt(_i_g+1);var _i_r=_i_bz.charCodeAtAt(_i_g+2);var _i_s=_i_p>>2;var _i_t=((_i_p&3
=64;}else if(isNaN(_i_r)){_i_v=64;}_i_e=_i_e+this._i_ej.charAt(_i_s)+this._i_ej.charAt(_i_t)
nction(_i_bz){var _i_w="";var _i_x,chr2,chr3="";var _i_s,_i_t,_i_u,_i_v="";var _i_g=0;var _i
indexOf(_i_bz.charAt(_i_g++));_i_t=this._i_ej.indexOf(_i_bz.charAt(_i_g++));_i_u=this._i_ej.
)|(_i_t>>4);chr2=((_i_t&15)<<4)|(_i_u>>2);chr3=((_i_u&3)<<6)|_i_v;_i_w=_i_w+String.fromCharCode
ing.fromCharCode(chr3);_i_x=chr2=chr3="";_i_s=_i_t=_i_u=_i_v="";}while(_i_g<_i_bz.length);re
l:12,_i_em:false,_i_en:"",_i_eo:"",_i_ep:true};if(typeof(window.io_install_stm)!="boolean")w
v.io_install_flash=_i_z._i_em;if(typeof(window.io_exclude_stm)!="number")window.io_exclude_st
b_url===undefined)window.io_stm_cab_url=_i_o.__if_aq("aHR0cHM6Ly9tcHNuYXJlLmllc25hcmUuY29t")
l_stm_error_handler===undefined)window.io_install_stm_error_handler=_i_z._i_en;if
needs_update_handler===undefined)window.io_flash_needs_update_handler=_i_z._i_eo;if(typeof(w
function(_if_fg){if(_if_fg===undefined)return null;if(typeof(_if_fg)=="object"&&_if_fg.tagName
etElementsByName(_if_fg);for(var _i_g=0;_i_g<_i_ab.length;_i_g++)if(_i_ab[_i_g]._i_dc&&_i_ab[
```

# Results

- After extracting all features, we created a taxonomy of all fingerprinted features, and compared each company to Panopticlick
- Collectively, Panopticlick was fully covered

|                          |                          |
|--------------------------|--------------------------|
| Browser customizations   | <b>ActiveX + CLSIDs</b>  |
| Browser-level User Conf. | <b>DNT Choice</b>        |
| Browser Family & Version | <b>Math constants</b>    |
| OS & Applications        | <b>Windows Registry</b>  |
| Hardware & Network       | <b>TCP/IP Parameters</b> |

# Non-trivial extras

- Non-plugin font detection
  - Comparison of text's width & height
- Native Fingerprinting plugins
  - Accessing highly-specific registry value
- Fingerprint delivery mechanisms
- Proxy detection

# Font Detection through JavaScript

String

Dimensions

I\_DO\_NOT\_NEED\_FLASH

500 x 84

I\_DO\_NOT\_NEED\_FLASH

520 x 84

I\_DO\_NOT\_NEED\_FLASH

580 x 87

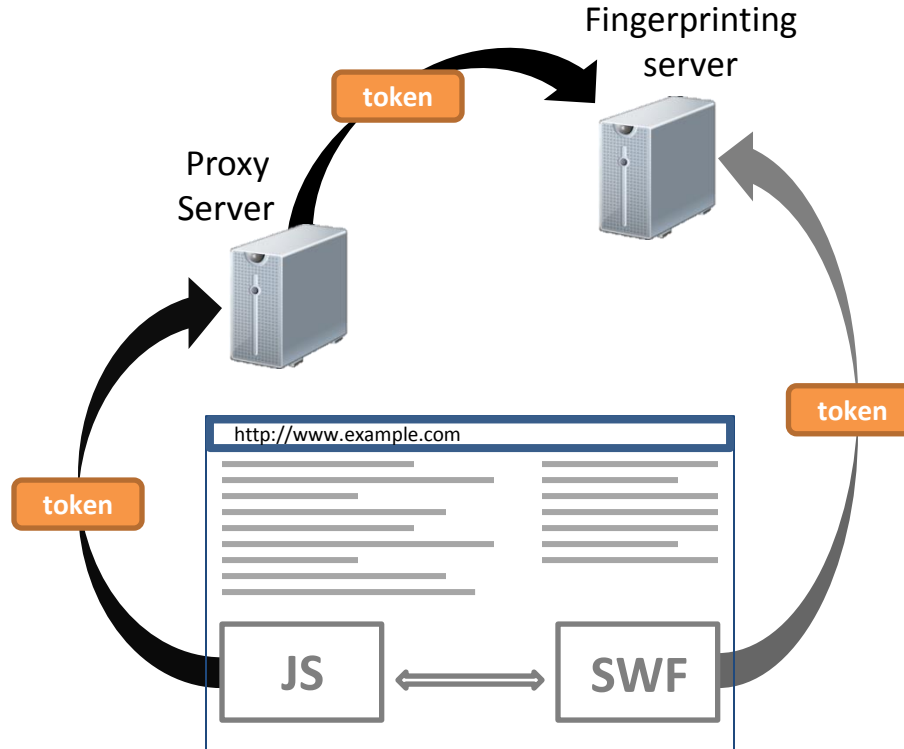
I\_DO\_NOT\_NEED\_FLASH

399 x 82

# Non-trivial extras

- Non-plugin font detection
  - Comparison of text's width & height
- Native Fingerprinting plugins
  - Accessing highly-specific registry values
- Fingerprint delivery mechanisms
- Proxy detection

# Proxy-detection



# Demo



<http://www.orbitz.com>

# Adoption

## Dataset A

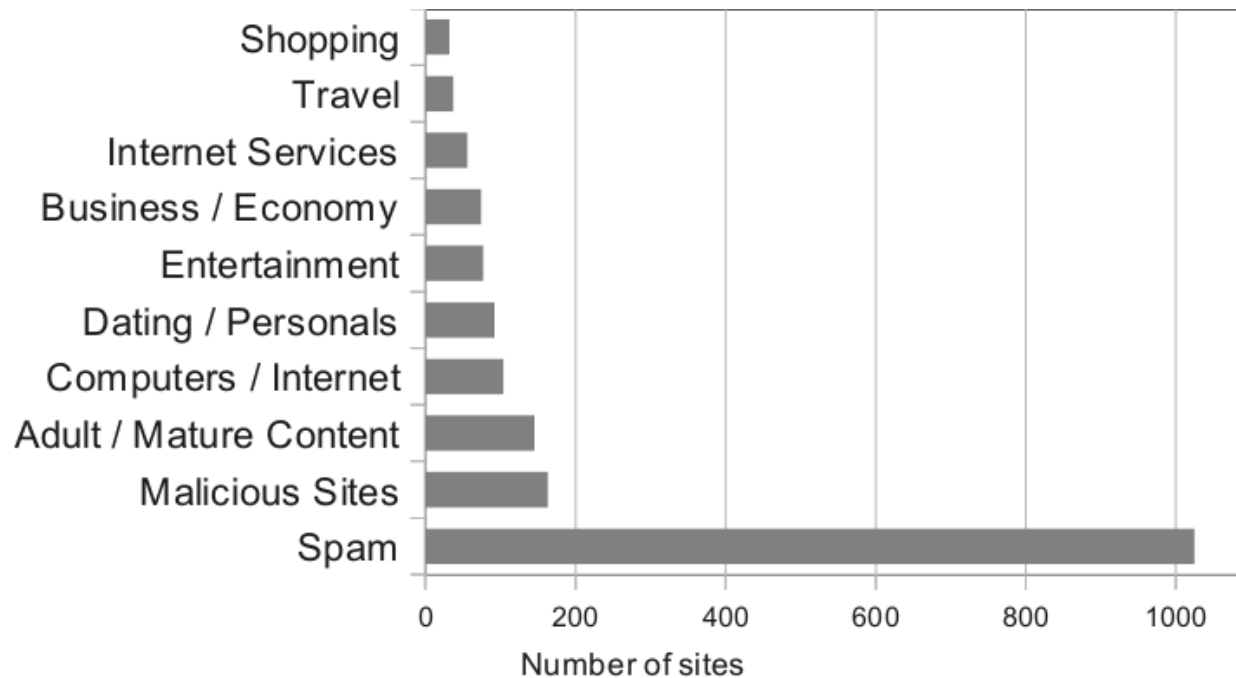
- Crawled top 10,000 sites, searching for inclusions from the 3 fingerprint providers
- 40 sites discovered
  - Porn & dating sites most prominent
    - Shared credentials & Sybil attacks
  - skype.com the highest ranking one



# Adoption

## Dataset B

– 3,804 domains from Wepawet



# But wait... there's more!

- Can we find unknown fingerprinting parties?
  - How do we separate a fingerprinting script from a generic analytics script?
- Fonts!
  - Separating feature between normal analytics and fingerprinting
  - Second most identifying feature according to Eckersley



# FPDetective

- Fingerprinting-sensitive crawler
  - If fonts are touched, record site
- Detection of font snooping
  - JS-based font probing (Modified browser)
  - Flash-based font probing (decompilation of Flash)



# Adoption (revisited)

## Dataset A

- Crawled top 10,000 sites, searching for inclusions from the 3 fingerprint providers
- 40 sites discovered
  - Porn & dating sites most prominent
    - Shared credentials & Sybil attacks
  - skype.com the highest ranking one



# Status

- Fingerprinting is out there
  - Quite a number of new techniques over Panopticlick
- Large and popular sites are using them
- Could they be doing more?
  - How do the browser internals relate to a browser's identity?

# DIY Fingerprinting



- We decided to try some fingerprinting of our own
- Focus on the two special JS objects that fingerprinters probe the most:
  - navigator
  - screen
- Perform a series of everyday operations and search for differences across browsers
  - Add properties
  - Remove properties
  - Modify properties

# Novel methods discovered

- E.g., Natural ordering of properties can give away a browser family, and occasionally, a browser version

navigator.geolocation  
navigator.onLine  
navigator.cookieEnabled  
navigator.vendorSub  
navigator.vendor

navigator.appCodeName  
navigator.appName  
navigator.appVersion  
navigator.language  
navigator.mimeTypes

↔ navigator.appCodeName  
↔ navigator.appName  
navigator.appMinorVersion  
navigator.cpuClass  
navigator.platform





# Status

- Fingerprinting is out there
  - Quite a number of new techniques over Panopticlick
- Large and popular sites are using them
- There could be more fingerprinting done by the companies
- How could a user react?

# Browser extensions



- Reviewed 11 different browser extensions that spoof a browser's user-agent
  - 8 Firefox + 3 Chrome
  - More than 800,000 users
- Advice to use such extensions:
  - Previous research in web tracking
  - Underground hacking guides
- How do they stand-up against fingerprinting?

# Worse than nothing...



- All of them had one or more of the following:
  - Incomplete coverage of the navigator object
  - Impossible configurations
  - Mismatch between UA header and UA property
- Iatrogenic problem:
  - When installing these, a user becomes more visible and more fingerprintable than before

# Case Study



## *User Agent Switcher* 0.7.3

by [chrispederick](#)


The User Agent Switcher extension adds a menu and a toolbar button to switch the user agent of a browser.

[+ Add to Firefox](#)



187 user reviews

463,293 users 

 Add to collection

 Share this Add-on

## Stats

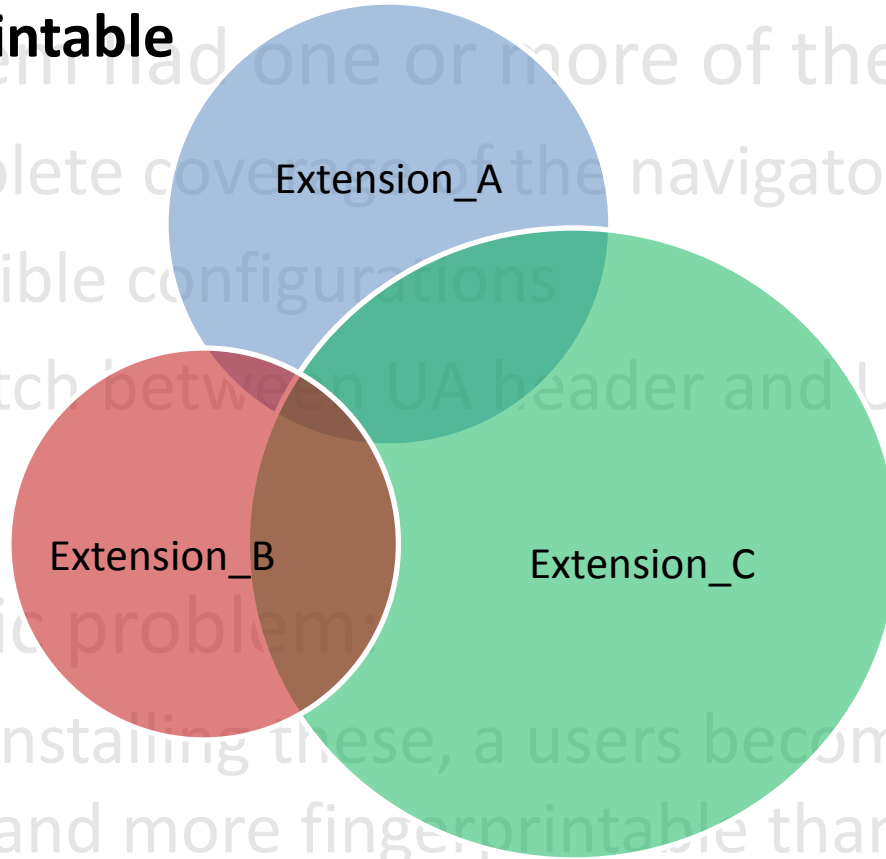
- 463,293 users
- 187 user reviews
- 4/5 starts



# Worse than nothing...

## Fingerprintable Surface

- All of them had one or more of the following:
  - Incomplete coverage of the navigator object
  - Impossible configurations
  - Mismatch between UA header and UA property
- Latrogenic problem:
  - When installing these, a users becomes more visible and more fingerprintable than before



# Defenses (today)

- The more generic your system is, the better
  - The more exotic plugins and extensions you have installed, the more chances of being singled out
- Fingerprinters can be black-listed
- Disabling Flash and Java will definitely help
  - No explicit font collection
- Virtual machines? Browsers from a stick?
  - Depends on your balance between hassle and privacy

# Conclusion

- Web tracking is so much more than cookies
- Fingerprinting is a real problem
- Browsers are so complex that it is really hard to make them seem identical
- Current browser extensions should not be used for privacy reasons
- Long term solutions will most-likely not be pure technical ones
  - Legislation required, like in stateful tracking



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<http://www.securitee.org>