



A CAPTCHA in the Rye

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OWASP

The Open Web Application Security Project

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Holds MSc & BSc degree in CS/EE from TAU

10+ years of experience in IS domain

Facebook "white hat"

Speaker at RSA, BlackHat, AusCERT

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Agenda



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Introduction to Hacker Intelligence Initiative

Automation on the Web

Good bots, bad bots

CAPTCHA

Caveats

Mitigation

Case study analysis

Summary of recommendations



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Hacker Intelligence Initiative

Hacker Intelligence Initiative (HII)



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The Hacker Intelligence Initiative is focused on understanding how attackers operate in practice

A different approach from vulnerability research

Data set composition

~50 real world applications

Anonymous Proxies

More than 18 months of data

Powerful analysis system

Combines analytic tools with drill down capabilities



HII - Motivation



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Focus on actual threats

- Focus on what hackers want, helping good guys prioritize

- Technical insight into hacker activity

- Business trends of hacker activity

- Future directions of hacker activity

Eliminate uncertainties

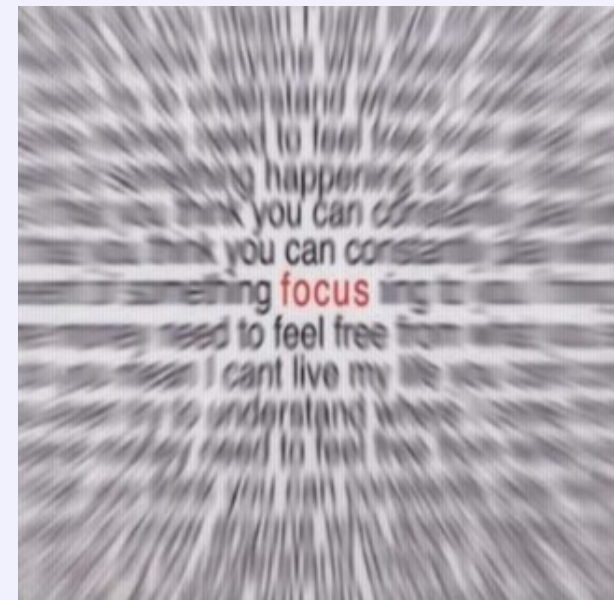
- Active attack sources

- Explicit attack vectors

- Spam content

Devise new defenses based on real data

- Reduce guess work





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Monthly reports based on data collection and analysis

Drill down into specific incidents or attack types

2011 / 2012 reports

- Remote File Inclusion

- Search Engine Poisoning

- The Convergence of Google and Bots

- Anatomy of a SQLi Attack

- Hacker Forums Statistics

- Automated Hacking

- Password Worst Practices

- Dissecting Hacktivist Attacks

- CAPTCHA Analysis



WAAR – Web Application Attack Report



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Semi annual

Based on aggregated analysis of 6 / 12 months of data

Motivation

- Pick-up trends

- High level take outs

- Create comparative measurements over time



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Automation on the Web

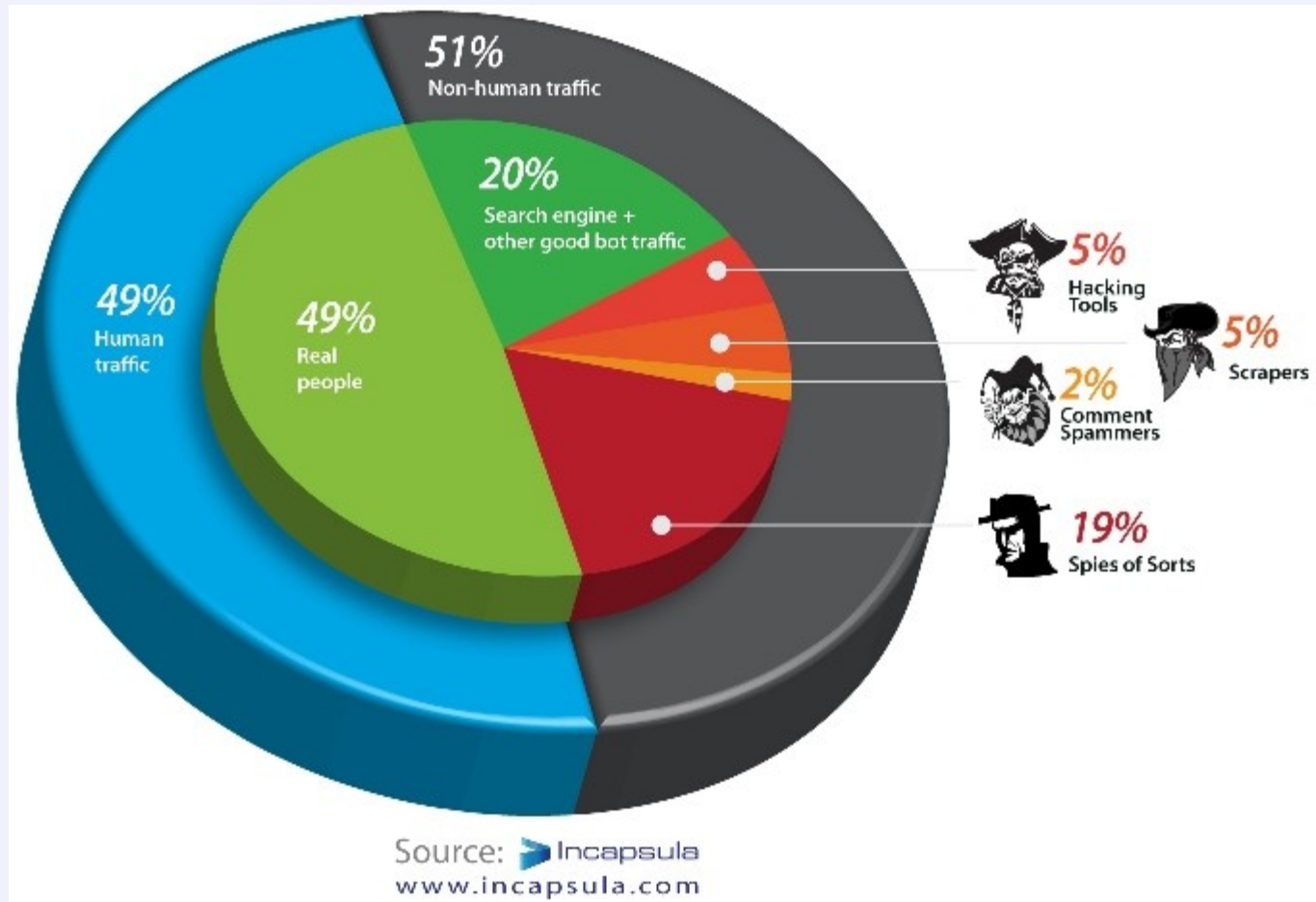
2012's Web: Automation all over the place



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Human traffic is in the minority



Source:

<http://www.incapsula.com/the-incapsula-blog/item/225-what-google-doesnt-show-you-31-of-website-traffic-can-harm-your-business>

Good Automation



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Search engines

E.g. GoogleBot

Validators

Link checkers

CSS/HTML/.. Format validators

Friendly vuln scan

RSS feed readers

IE RSS reader

B2B



Good Bot



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A good bot is a polite bot

Introduces itself

User agent

Specifies a method to validate identity

Usually by reverse DNS

Keeps the house rules - adheres to robots.txt

Who can crawl

What can be crawled

Rate of crawling

Bad Automation I: Hacking



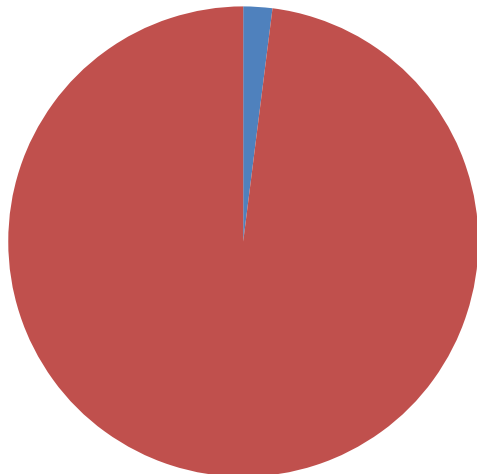
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Web application hacking attacks

RFI

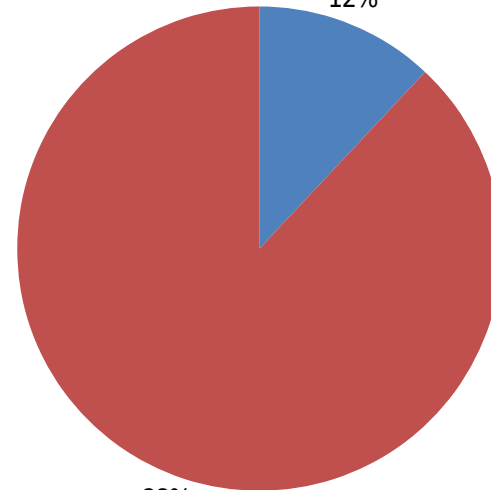
Manual; 2%



Automatic; 98%

SQLi

12%



88%

■ Manual
■ Automatic

Source:

http://www.imperva.com/docs/HII_Automation_of_Attacks.pdf





Bad Automation II: Comment Spamming



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Abusing comment functionality to embed spam content

 suplementy 0 approved suplementy.odzywki- 	Submitted on 2011/10/02 at 7:58 am Woh I like your posts , bookmarked ! . Quick Edit Edit History Not Spam Delete Permanently
 newyork-jets 0 approved dallascowboys-vs- 	Submitted on 2011/10/02 at 6:59 am Watch Dallas Cowboys vs New York Jets Live Stream NFL Online e amro wly pl xntjntcdr oxbnsp iti isgkrupke iotkid fyy oaynguepb wqsama wwy sii zeqeit ozu mzg bfg tc at x zd f Watch Pittsburgh Steelers vs Baltimore Ravens Live Stream NFL O

Bad Automation III: Site Scraping



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Stealing site's Intellectual Property
PII from government sites

Price quotes

Stealing media (images) from media sites

We will analyze some "in the wild" examples



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CAPTCHA Defined

CAPTCHA Defined



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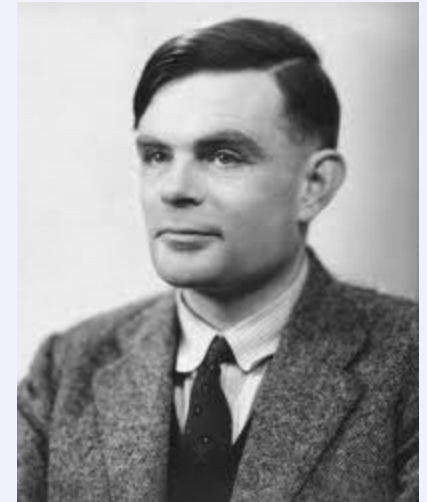
Completely **A**utomated **P**ublic **T**uring test to tell **C**omputers
and **H**umans **A**part

A good CAPTCHA is a test

Easy for humans

Hard for computers

Can be used to fight automation



CAPTCHA Implementations



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Hosted solutions

ReCAPTCHA - Acquired by Google

Application Add-ons
PHP CAPTCHA



CAPTCHAS Caveats



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Bad implementations

Too easy for computers

Too hard for humans

Sometimes both ☐

Can be defeated by “Artificial Artificial”

(Artificial²) Intelligence

Mechanical turk

Qualifying question

Just to prove you are a human, please answer the following math challenge.

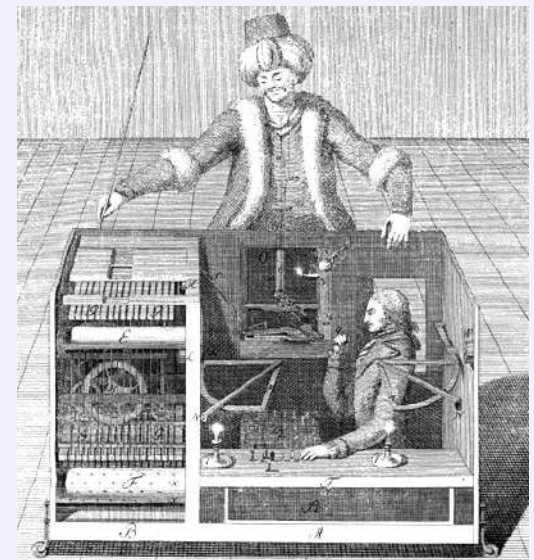
Q: Calculate:

$$\frac{\partial}{\partial x} \left[4 \cdot \sin \left(7 \cdot x - \frac{\pi}{2} \right) \right] \Big|_{x=0}$$

A:

mandatory

Note: If you do not know the answer to this question, reload the page and you'll get another question.



Source:

<http://www.johnmwillis.com/other/top-10-worst-captchas/>

Bad CAPTCHA: Easy for Computers











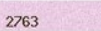





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Many are based on the character recognition problem

Can be broke with OCR based tool
CAPTCHA Sniper tool

Platform/Footprint	Captcha Image	Success Rate
Wordpress Blogs		76%
Typepad/Movable Type Blogs		41%
Lifetime Blogs		100%
BlogEngine Blogs		71%
		74%
		76%
B2Evolution Blogs		48%
ArticleMS Article Directories		64%
Pigg Bookmarking		73%
		90%
PHPLD Directories		98%
		25/50%
		48%
Mercury Board Forums		66%

Bad CAPTCHA: Easy for Computers



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Low entropy

Example “what’s the animal in the picture”

10,000 animal pictures

Attackers can

Solve each picture once and bypass CAPTCHA forever

Guess thousands of times until they get it right

- Computers don’t get bored in the process

Known to happen with many “Audio CAPTCHA”

Bad CAPTCHA: Easy for Computers



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Attacker can force the specific CAPTCHA test

The servers validates the answer based on some value passed by the client

`/captcha.jsp?test_id=1234&answer=cat`

Attackers can solve a single test once and bypass CAPTCHA forever

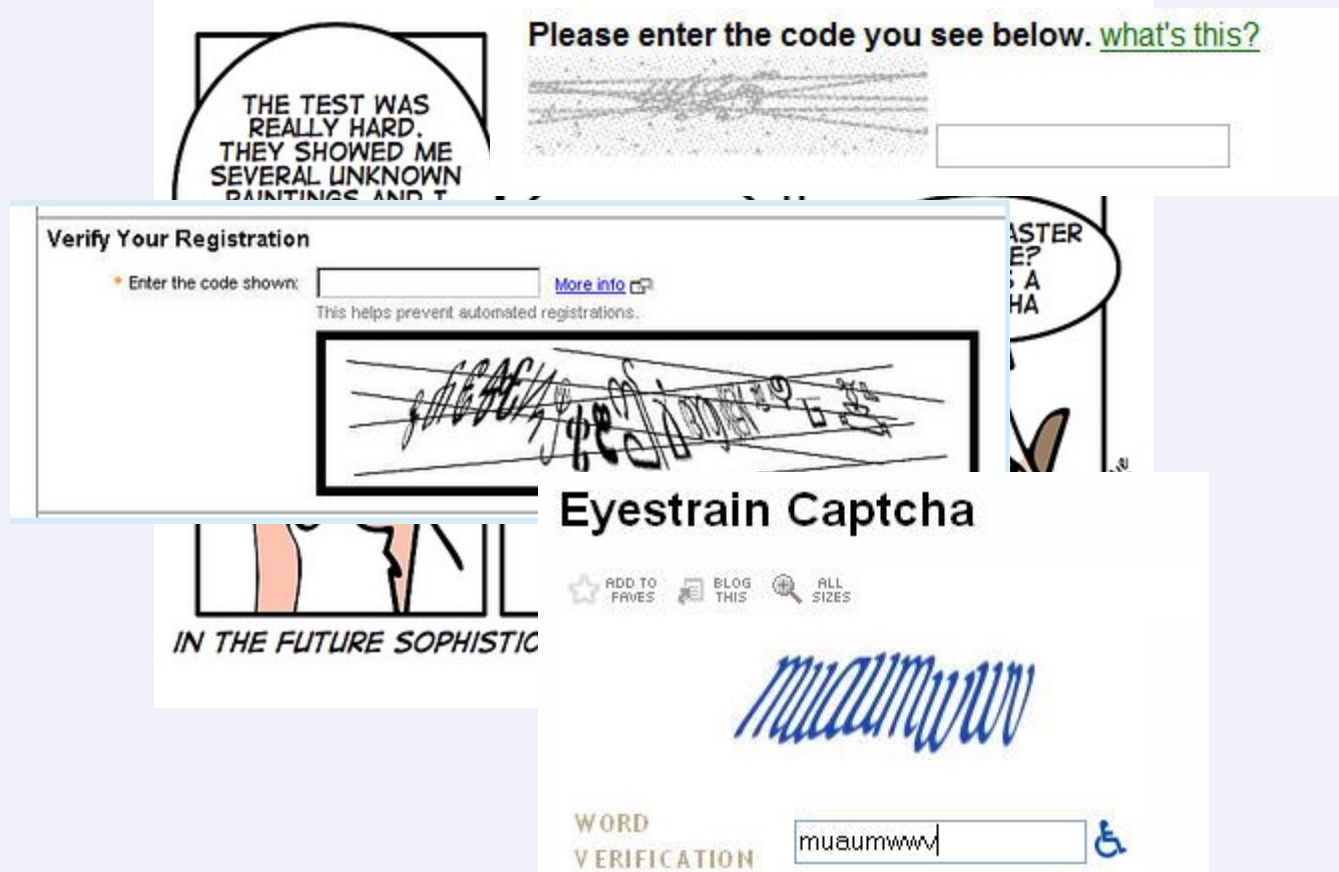
Bypassing CAPTCHA: Artificial Artificial



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Can be very annoying



Source:

<http://ordinarygaming.blogspot.co.il/2012/08/dear-captcha-i-hate-you-and-wish-you.html>

Bypassing CAPTCHA: Artificial² intelligence



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Convincing humans to solve CAPTCHA Money

- Paying for micro jobs

2. **Captcha Typing** – Quite new trend in micro jobs. Type-in the captcha and earn upto \$1 per 1000 correct captchas entered. How and Why? Ever heard of web bots or auto-

Extortion

Shutdown Malware



Bypassing CAPTCHA: Playing Strip CAPTCHA



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Melissa strip



Hi!
My name is Melissa. I'm 18 years old and you have come to the right place to play :)

How
Easy
1 o
wa

Melissa strip



Ok, lets start baby! Lets see if you can strip me :).
Put the word that you see on bottom, if its correct I'll
take off 1 of my xxx :)

MAZY

Melissa strip



Outch, nice one, you got it right!
ok, ready for next one? Here it is:

27LG

Enter

Source:

<http://www.ghacks.net/2007/12/07/melissa-strip-captcha-breaker-trojan/>

Detecting Automation: Additional Automats Tests I



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Adding defense dimensions

Augmenting CAPTCHA with other anti-automation measures



Detecting Automation: Additional Automats Tests II



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The combination of tests makes bypassing harder
Tests cannot be solved by merely exporting to humans
Invisible tests don't change User Experience

Detecting Automation: Passive



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Passive Methods

Watch network traffic “as-is”

Non intrusive, do not affect user experience

Traffic Shape Indicators

We measure suspicious requests (rather than ALL requests)

Measured attributes

- Rate
- Rate change (ramp-up speed)
- Volume

Difficult to measure in an inherently noisy source (NAT)

Request Shape Indicators

Missing headers

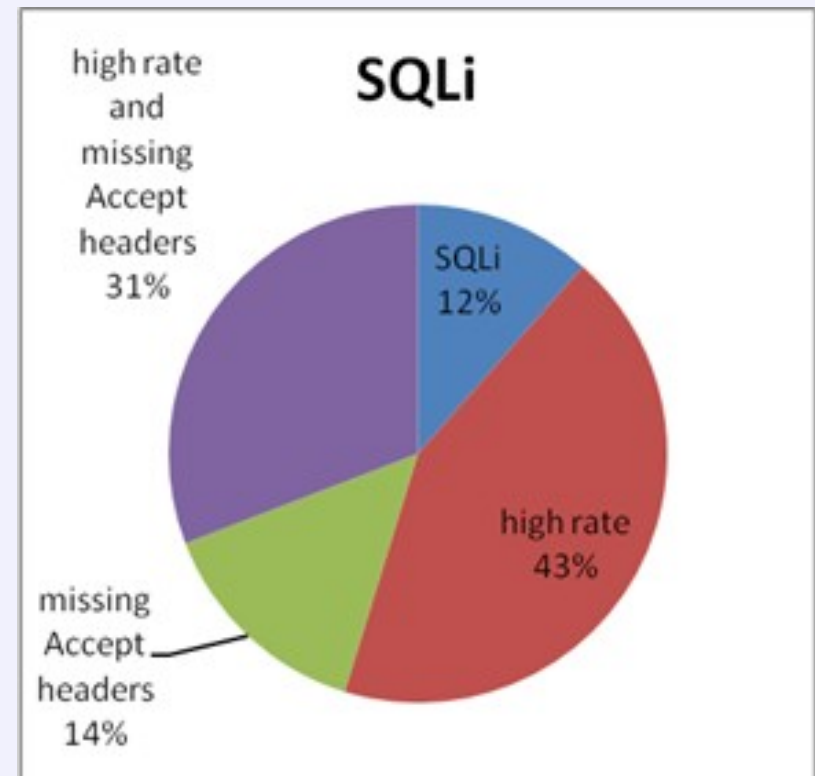
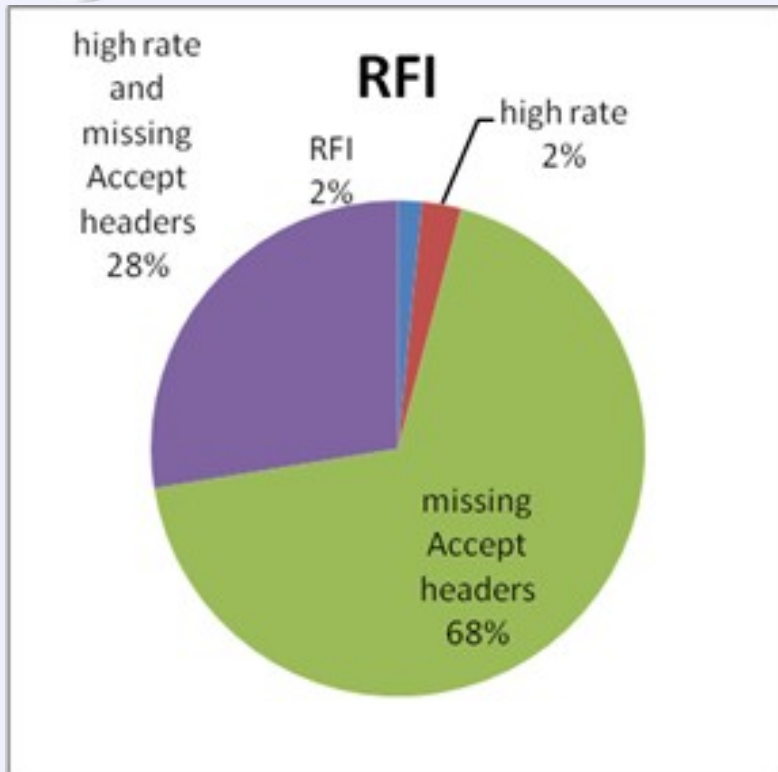
Mismatch between headers and location

Detecting Automation: Passive



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Detecting Automation: Active



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- Introduce changes into the server response

 - Test client's reaction to changes

 - May affect user experience – use with care

 - Verify type of user agent

- Browsers support Javascript and an appropriate DOM

 - Client is expected to complete some computation

 - Application / GW can validate the computed value

- Browsers comply with HTML tags (IMG, IFRAME)

 - Client is expected to access resource referenced by embedded tags

 - Failure to access the resources implies that client is an automated script

Detecting Automation: Wisdom of the Crowds



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Detected automation feeds into building fingerprints of tools and reputation data for sources

Leveraged when data is collected within a community

Recent regulatory changes endorse the concept of community

Drop requests matching fingerprints or coming from ill reputed sources



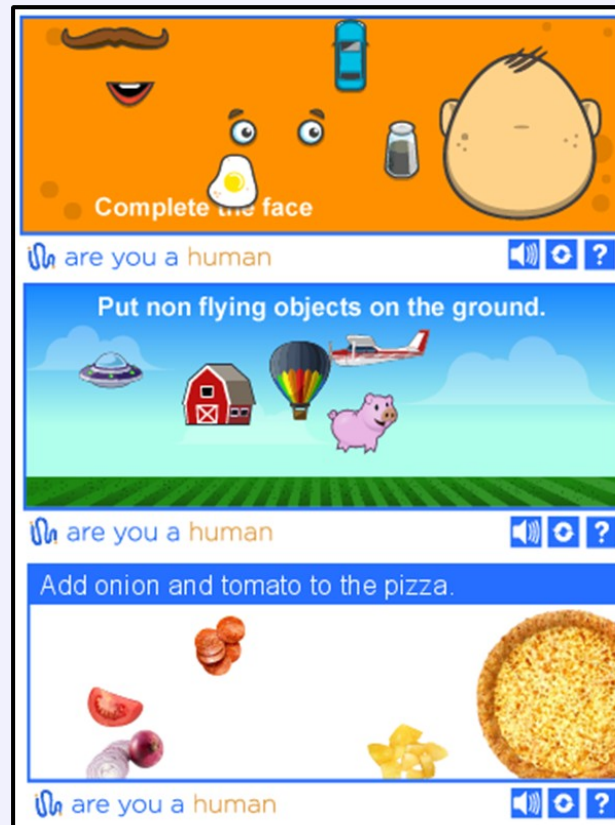
Detecting Automation: CAPTCHA 2.0



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Gamification - CAPTCHAs that are more fun for humans but hard for computers





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Case Study Analysis

Case Study: Attacked Site



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South American government tax agency

Displays tax statement per company unique ID

Protected against automation with CAPTCHA

Having the whole database offline would allow attackers to run arbitrary additional queries on the database to get financial information



Case Study: The CAPTCHA



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5 random letters
Fairly easy to OCR

Título e local de votação - Consulta por nome  

Nome do eleitor:

Data de nascimento:
 (Formato: DD/MM/AAAA)

Nome da mãe:
 ☐ não consta/em branco

Código:


Por favor, repita os caracteres acima:

Esta informação ajuda o Tribunal Superior Eleitoral a evitar a consulta por programas automáticos, que dificultam a utilização deste aplicativo pelos demais usuários.

Case Study: CAPTCHA by Passing



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OCR Captcha

[Like](#)[Send](#)[Tweet](#) 9[+1](#) 0[Share](#)

Bids

3

Avg Bid

\$417 USD

Project ID: [REDACTED]

Project Type: Fixed

Budget: \$100-\$250 USD

Project Description:

Hi!

I'm looking for a developer that have knowledge in Web Crawler in order to get some data from some web site.

The website is

http://[REDACTED]

Needs 80% or more accuracy rate.

The web site, have a captcha.

Thanks

Attack Characteristics



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Few attempts per CAPTCHA until solved

Over TOR for anonymity

Requests lacked proper headers

 User agent of known browsers

 But Accept headers were missing

CAPTCHA solving requests sent in a very high rate



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Summary & Recommendations

Summary



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Automation is a major phenomena – used by both good and bad guys

CAPTCHA is a popular anti-automation tool but has caveats, and hackers are abusing them

Augment CAPTCHA with other anti-automation measures – traffic shape, traffic rate

Use community based anti-automation reputation service



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Questions?