



**COMPUTER SCIENCE  
& ENGINEERING**  
TEXAS A&M UNIVERSITY

# Cybercrime in the Deep Web

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# Agenda

- **Overview of online crime**
- **Case studies**
  - ▼ Online sale of drug
  - ▼ How FBI shut down Silk Road
- **Ongoing cyber crime examples**
  - ▼ IRS tax returns
- **Give you an idea of**
  - ▼ Different players involved in online crime
  - ▼ Intervention strategies

## ■ Emergence of underground economy

- ▼ Loose federation of specialists selling capabilities, services, and resources explicitly tailored to the abuse ecosystem

## ■ Streamlines abuse – for a fee

- ▼ Commoditization provides access to:
  - ▼ Compromised machinery
  - ▼ Sensitive user data
  - ▼ Human services
  - ▼ Accounts & engagement
- ▼ Difficult for any single actor to extract all this value

# Online crime – Profit centers



*Flow of external capital into underground*

# Online crime – Support centers

<b>Specialized Payloads</b>	<b>Spambot</b> <i>Grum, Storm, MegaD</i>	<b>Clickbots</b> <i>ZeroAccess</i>	<b>Banking trojans</b> <i>Zeus, SpyEye</i>
<b>Malware distribution</b>	<b>Exploit kits</b> <i>Nuclear, Blackhole</i>	<b>PPI services</b> <i>GoldInstalls, Loader Adv</i>	--
<b>Traffic acquisition</b>	<b>Accounts</b> <i>Email, social, phishing</i>	<b>SEO, cloaking</b> <i>Backlinks, websites</i>	--
<b>Raw materials</b>	<b>Hosting, networking</b> <i>Hosts, proxies, domains</i>	<b>Human services</b> <i>Captcha, SMS, content, mules</i>	--

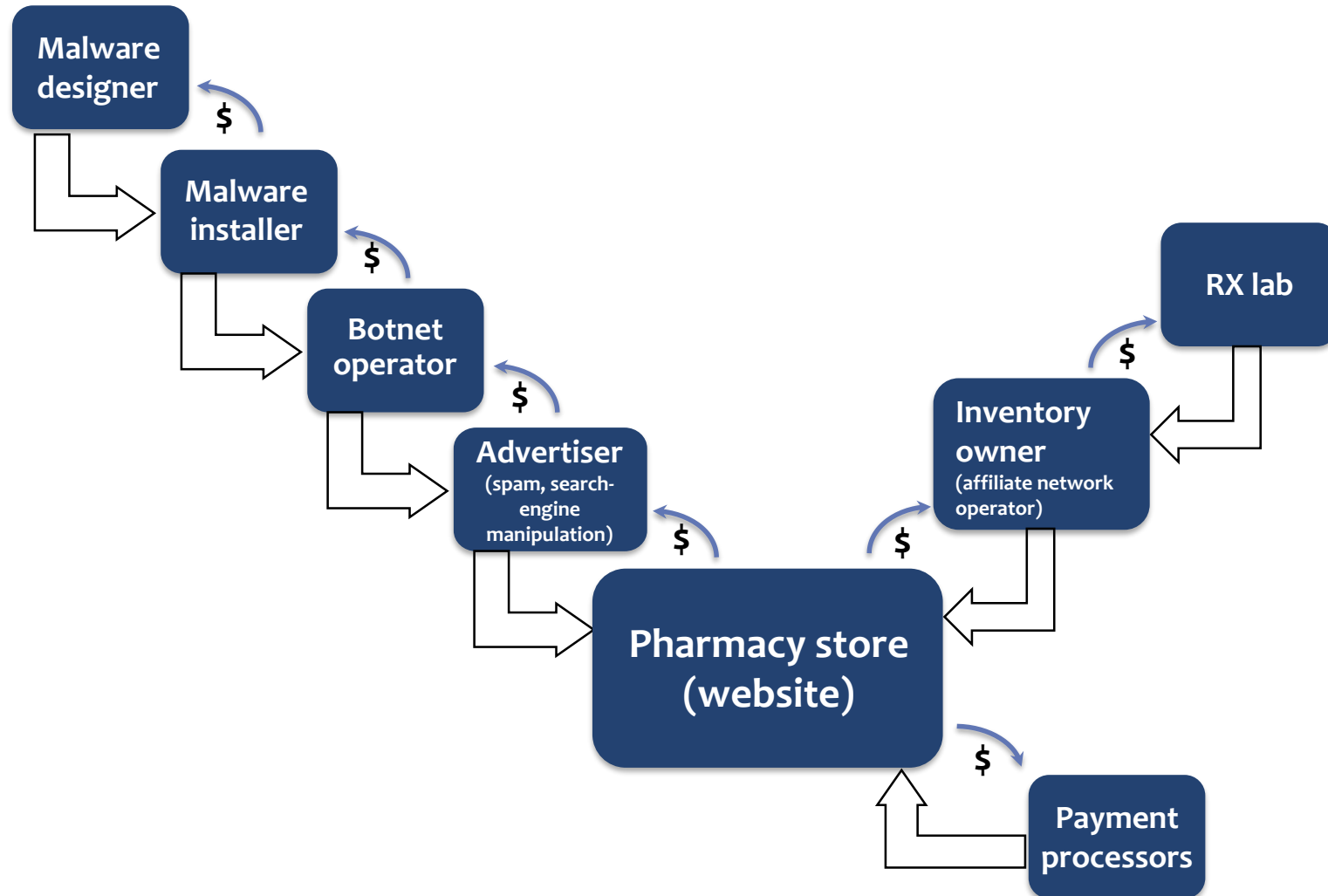
*Flow of capital into underground*

# Case study: Online sale of drugs

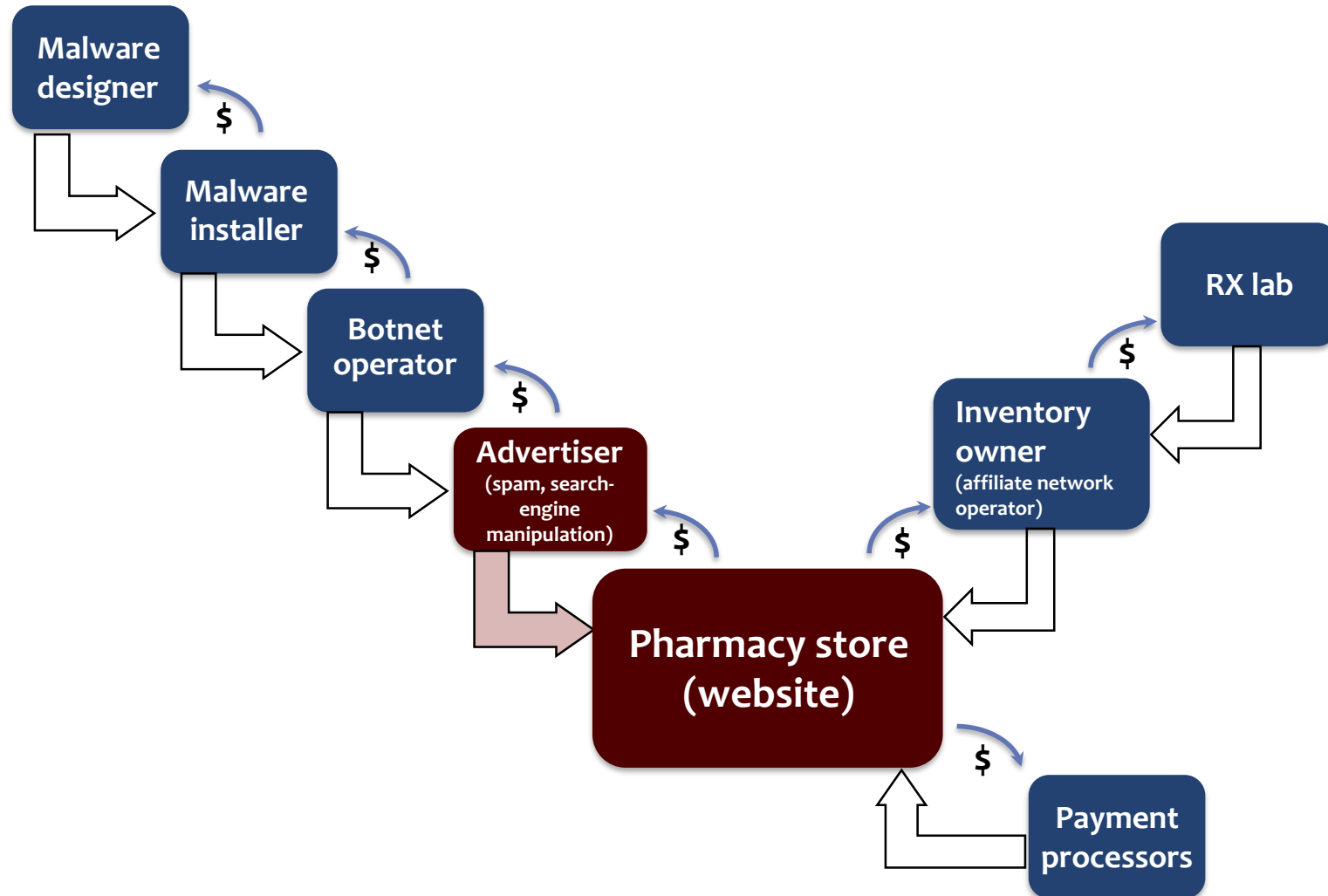
- **One of the best known illicit online trades**
  - ▼ Who hasn't received email spam for prescription drugs?
- **Potentially most dangerous form of online crime**
  - ▼ Wrong dosage can kill: cf. Ryan Haight
- **Complex supply chain that can tell us a lot about the online criminal ecosystem**



# Supply chain: high-level overview

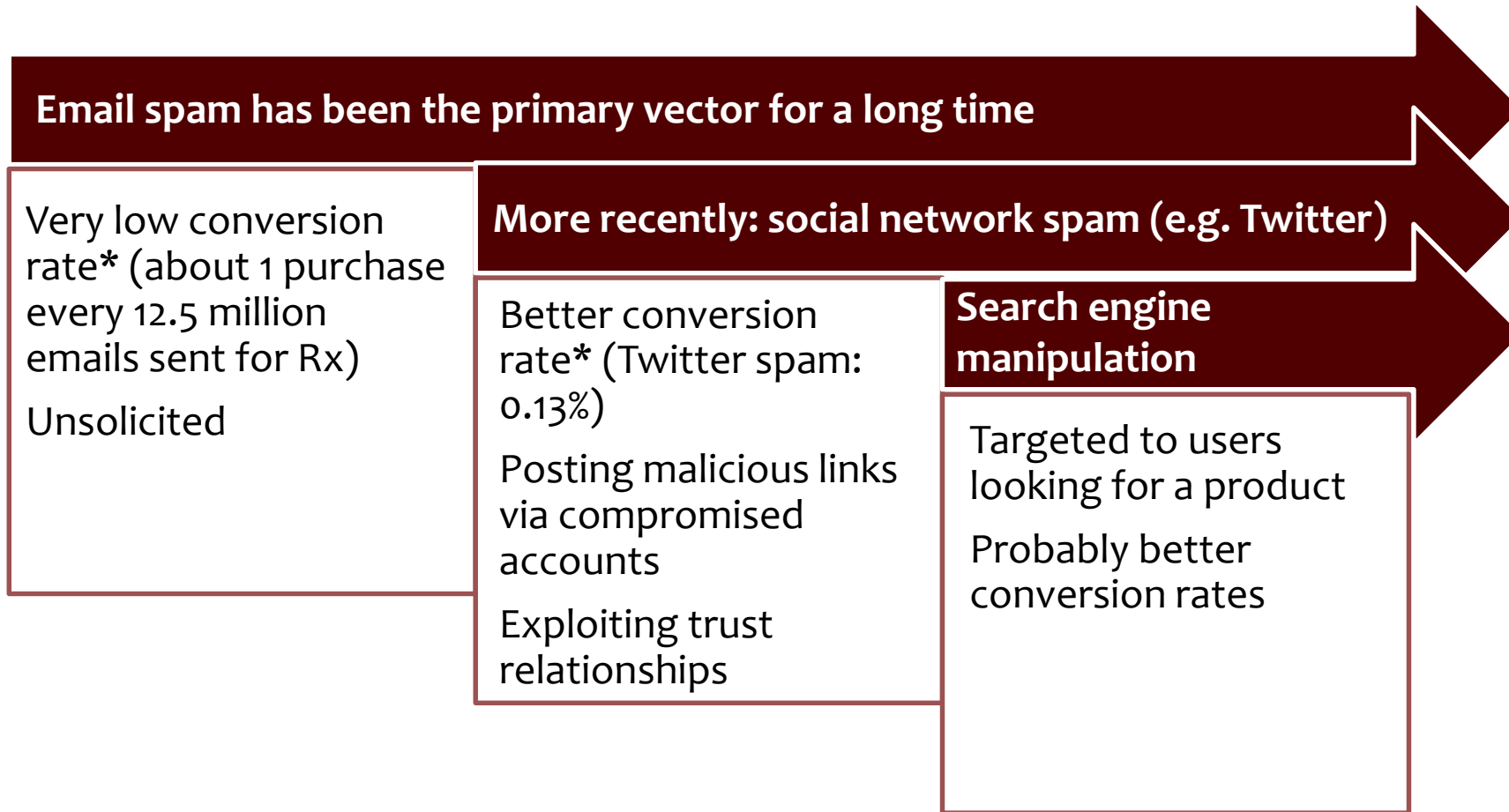


# Advertising unlicensed drugs





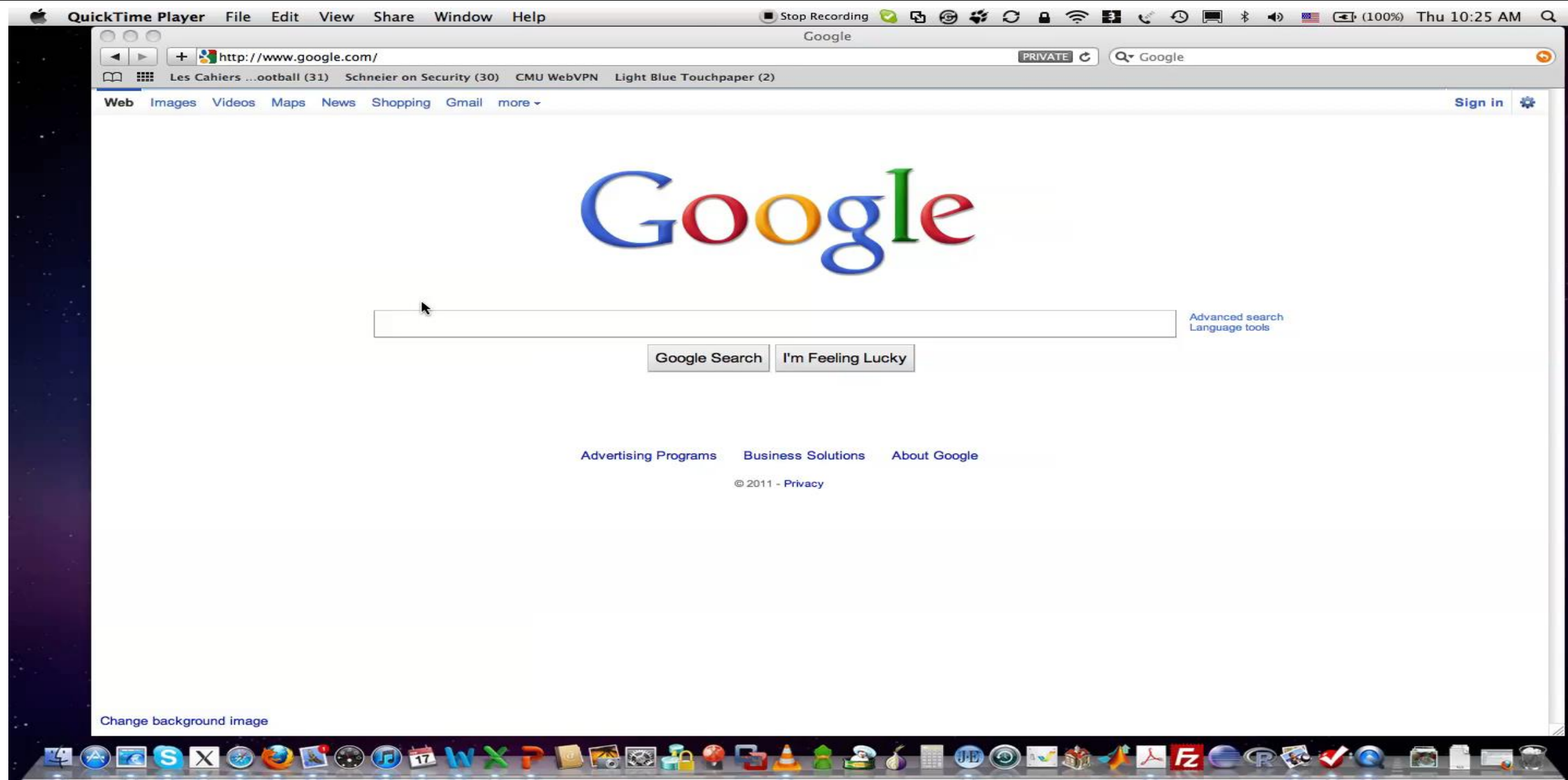
# Evolution of advertising of illicit products



\*Ratio of realized sales over the number of emails/clicks

# Original search-redirection attack (1)

[Leontiadis, Moore and Christin, USENIX Security 2011]



# Original search-redirection attack (2)

[Leontiadis, Moore and Christin, USENIX Security 2011]

Search results for "cialis without prescription". The search bar shows "cialis without prescription" and "Search". Below the search bar, it says "About 28,400,000 results (0.11 seconds)". The first result is highlighted with a red box:

[Cialis Without Prescription What And Generic - Online Drug Store ...](#)  
Cialis Without Prescription What And Generic. Online Pill Store, Big Discounts. FDA regulations prohibit us from accepting returned medications from a ...  
cgi.media.mit.edu/ - Cached - Similar

Other results include:

- [Buy Cialis Online Without Prescription](#)  
Buy Cilais **Without Prescription!** Lowest Prices and Satisfaction Guaranteed! Only \$1.99 Per Pill. Bonus 4-12 FREE Pills with all Orders, ...  
www.oneboyonegirl.com/ - Cached - Similar
- [NMSU Library: Research](#)  
Research Guides & Help »; Subject & Course Guides »; Subject Specialists »; more ...  
Services · Renewals »; Request It! » Reserves »; more. ...  
lib.nmsu.edu/research.shtml - Cached - Similar
- [Water-spider orchid | Center for Aquatic and Invasive Plants](#)  
Feb 8, 2008 ... Habernaria repens. Native to Florida. Video ID segment (2-3 minutes) You will need Adobe Flash installed to view this video ...  
plants.ifas.ufl.edu/node/173 - Cached - Similar
- [Cialis without prescription - Buy Drugs Online Without Prescription!](#)  
Feb 15, 2009 ... **Cialis without prescription.** Biggest Online Pharmacy Center. No prescription needed. Fast delivery. 24h online support. Special prices!  
www.darkroomstudios.com/ - Cached - Similar
- [Office of the CIO - Gateway](#)  
Telephone Services for. South Campus Gateway Apartments. OIT is a department of The Ohio State University and the contracted provider for telephone, ...  
units.osu.edu/gateway/index.php - Cached - Similar
- [Buy Drugs Without Prescription, No Prescription Needed Online Pharmacy](#)  
buy **cialis without prescription**, buy viagra no prescription needed, buy levitra without prescription, buy xanax no prescription needed ...  
www.peopleprescription.com/ - Cached - Similar
- [cialis without prescription - Campus Health Services - Home](#)  
campushealth.unc.edu/index.php?option=com\_content... - Similar

Only **two** of the results actually belong to online pharmacies. The rest are unrelated .com or .edu sites that had been compromised to redirect to online pharmacies or have been populated with spam.

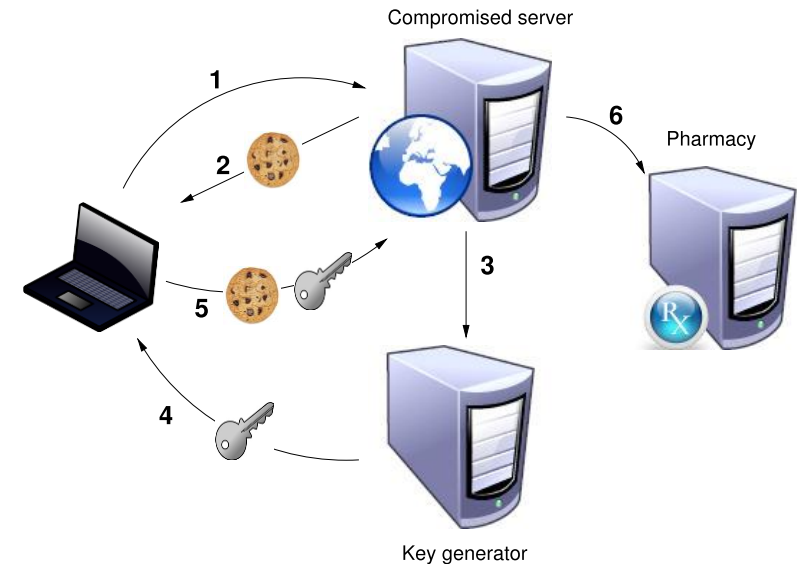
# Novel attack variants (2012+)

- **Ex.1 Inlining the store front in the compromised website**

- ▼ A click then leads you to the pharma store

- **Ex.2 Stateful server**

- **Goal: escape detection by automated crawlers**

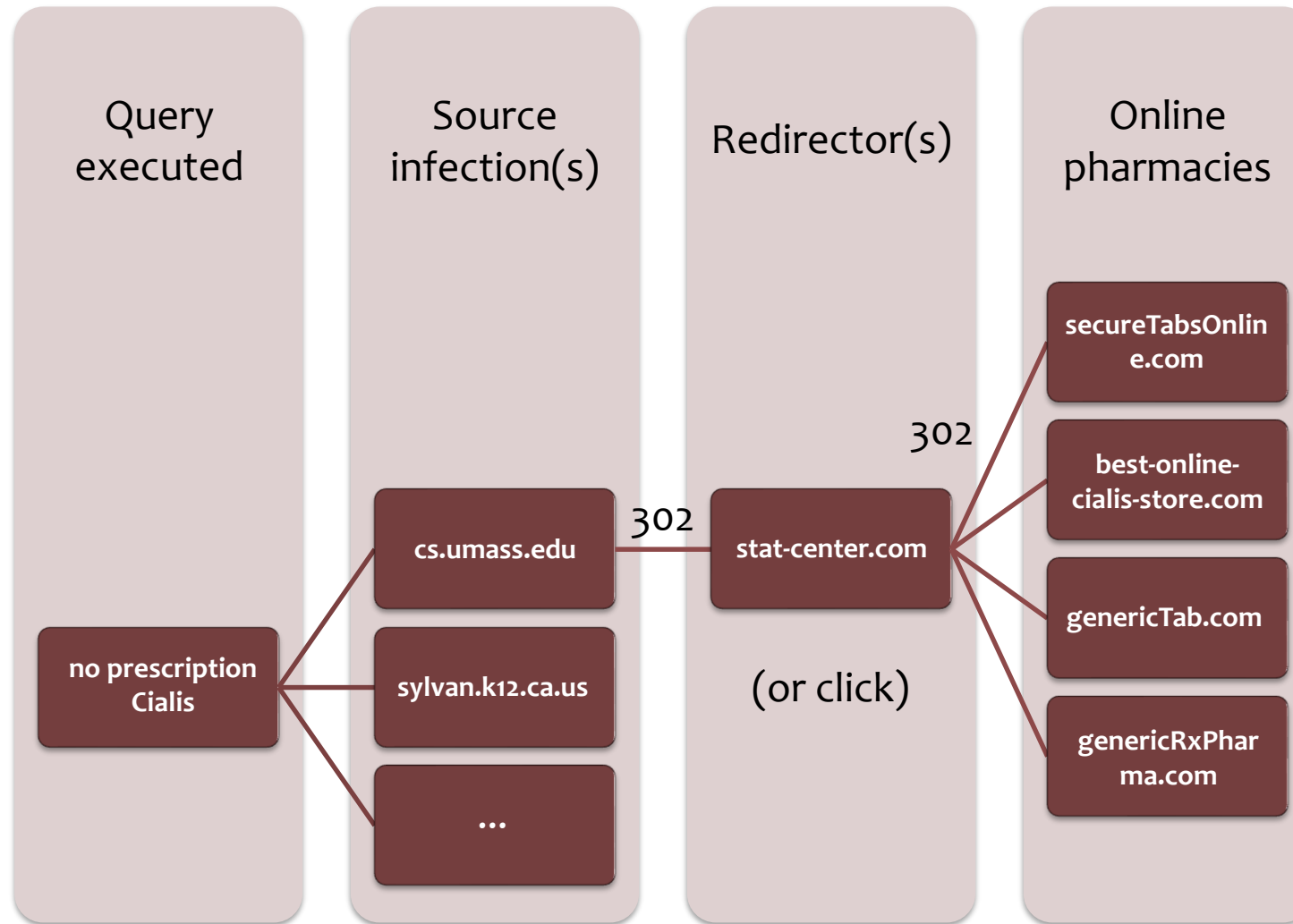


- Attackers are quickly adapting to monitoring and/or countermeasures
- Non-trivial amount of effort on their part!

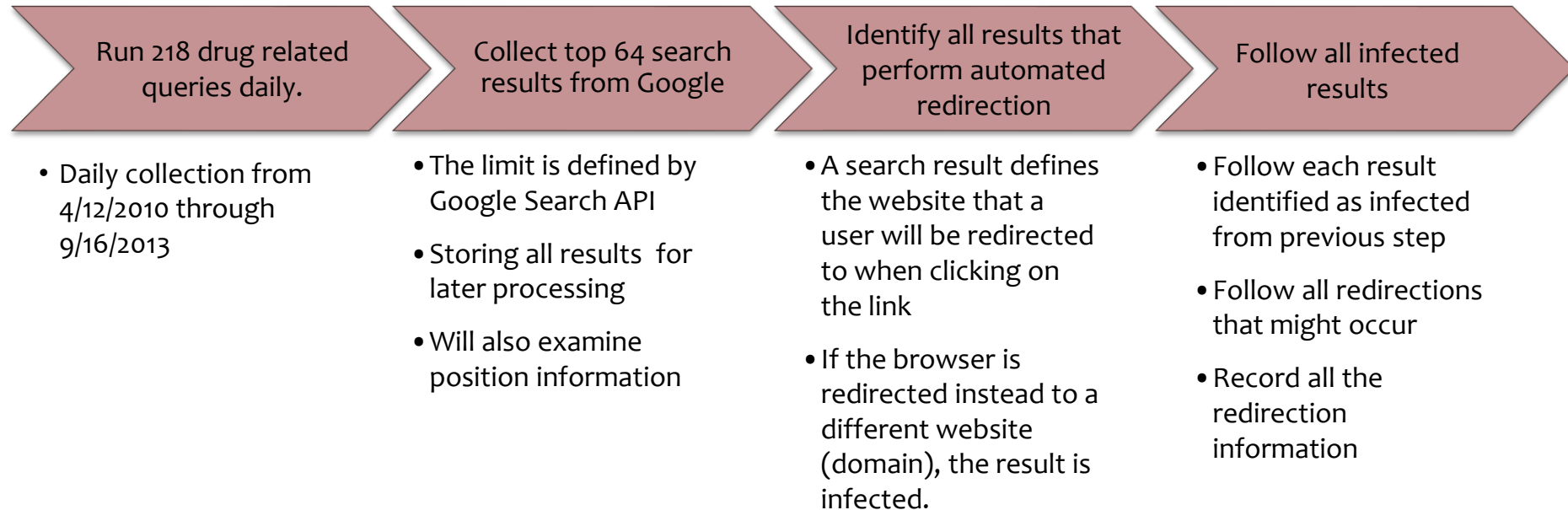
# Questions

- **How has the attack evolved?**
  - ▼ Volume and impact
  - ▼ Techniques
- **Why has the attack evolved?**
  - ▼ Effectiveness of the defenses?
- **Can this be thwarted?**
  - ▼ Network-level intervention vs. end-host intervention

# Attack modus operandi: Redirection chains



# Data collection process



# Datasets collected

[Leontiadis, Moore and Christin, ACM CCS 2014]

## ■ Dataset 1

- ▼ Aggregate results only
- ▼ Rank of the results unknown
- ▼ Mapping query-results unknown

## ■ Dataset 2

- ▼ Same as Dataset 1, but ranking information known
- ▼ Mapping query-result doesn't include rank

## ■ Dataset 3

- ▼ All information is captured
- ▼ ... but Google started to limit what we could get

Dataset	1	2	3
Period	4/12/10-11/15/10	11/15/10-10/8/11	10/8/11-9/16/13
Search results/query	64	64	16/32
Total results	260,824	3,609,675	1,530,099
Unique URLs	150,955	189,023	122,382
Unique domains	25,182	36,557	30,881



# Some of the 218 queries used

vicodin no prescription

cheap valium non prescription

buy ativan online injecting pills

buy xanax valium online florida

order vicodin si levitra online

buy xanax valium online florida

color of adipex pills safest place to buy online

vicodin without prescription

generic cialis free sample

cheap tadalafil

20 mg ambien overdose

prozac side effects

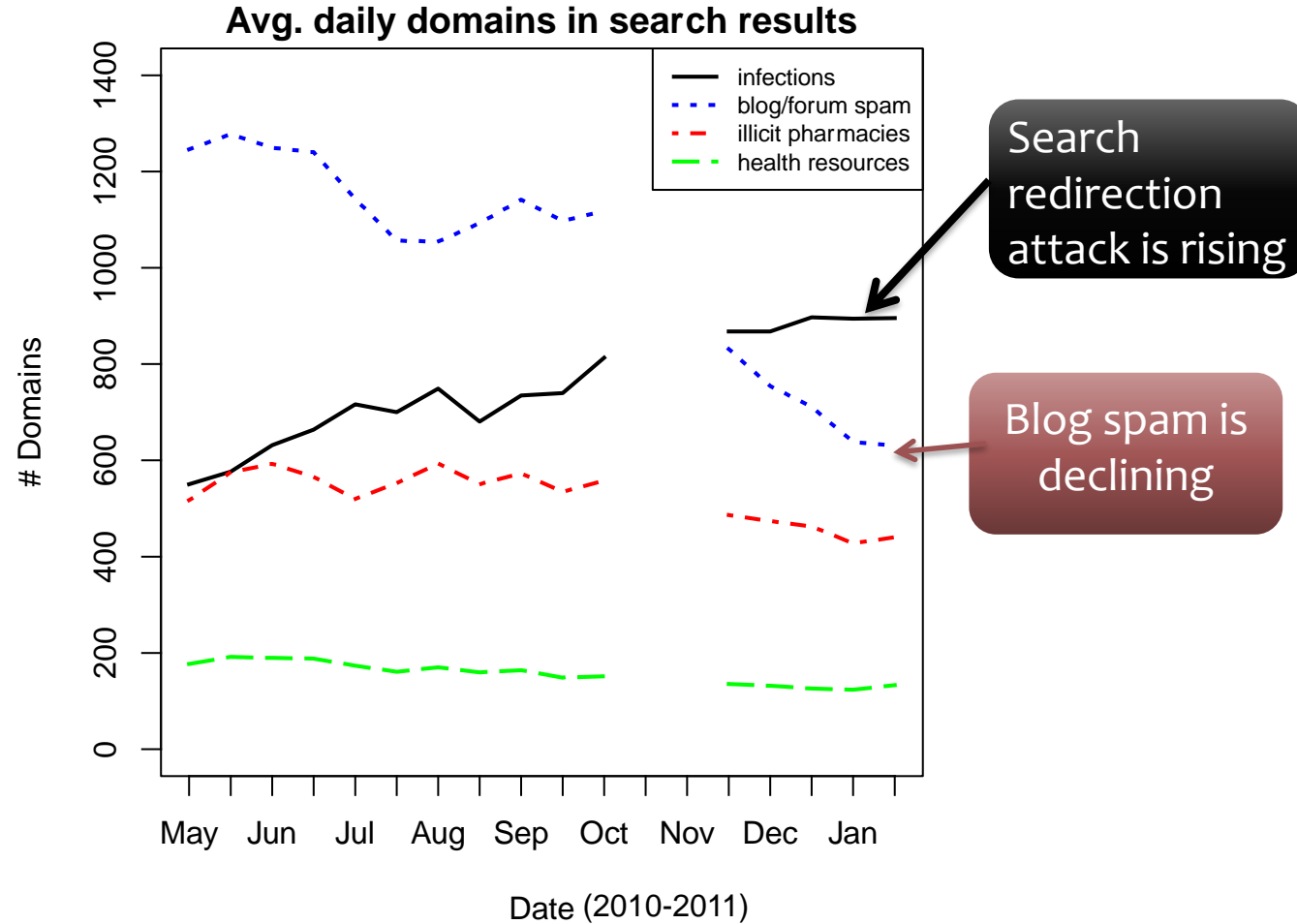
ambien buy online

alprazolam online without prescription buy cheap

Type	Count	Percent
Malicious (Black)	26	22%
Benign (White)	75	34%
Ambiguous (Gray)	117	54%
<b>Total</b>	<b>218</b>	<b>100%</b>

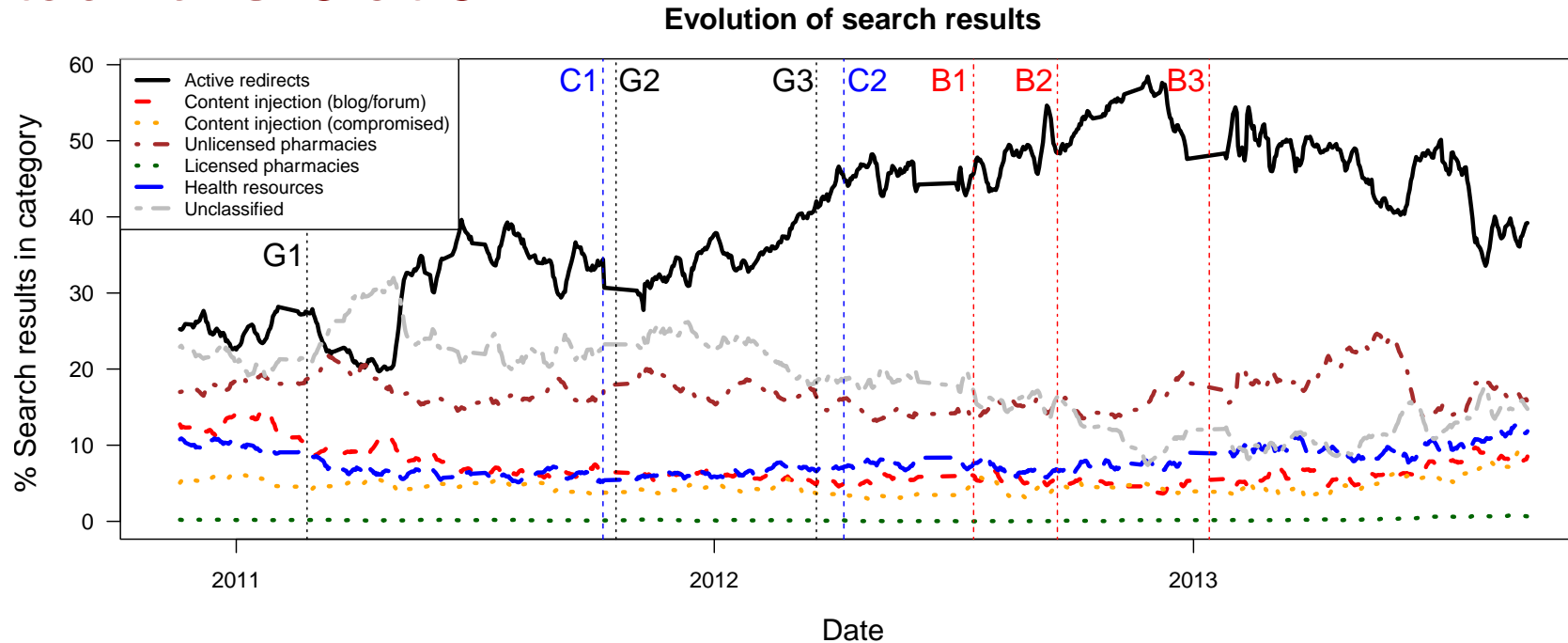
# Dataset 1: 2010-2011

## Search-redirectation took over forum spam



# Datasets 2: 2011-2013

## Longitudinal evolution



**G1: Google changes search ranking algorithm**

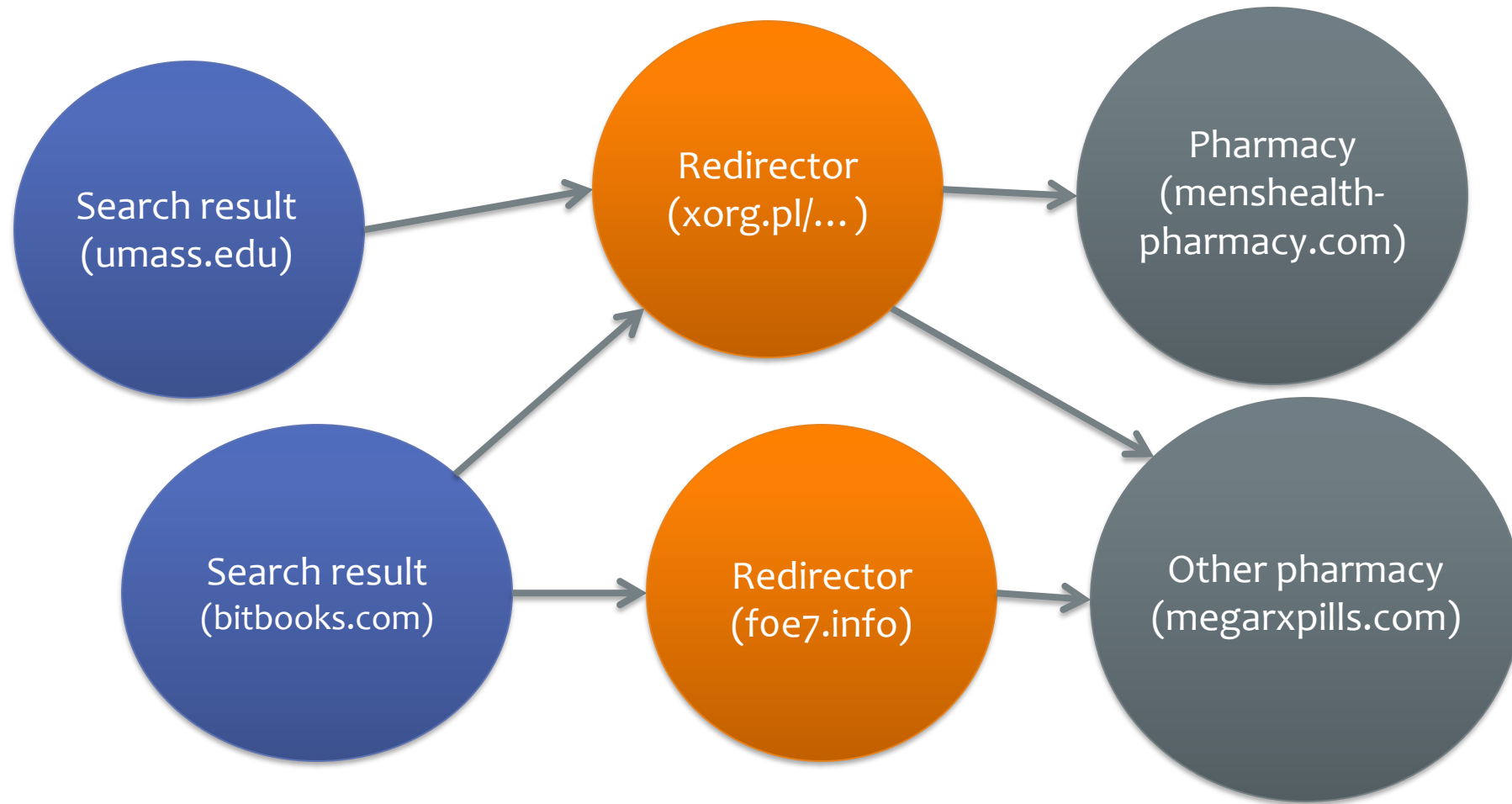
**G2: Google starts removing query info from "Referer" field**

**G3: Google is done deploying Referer modifications**

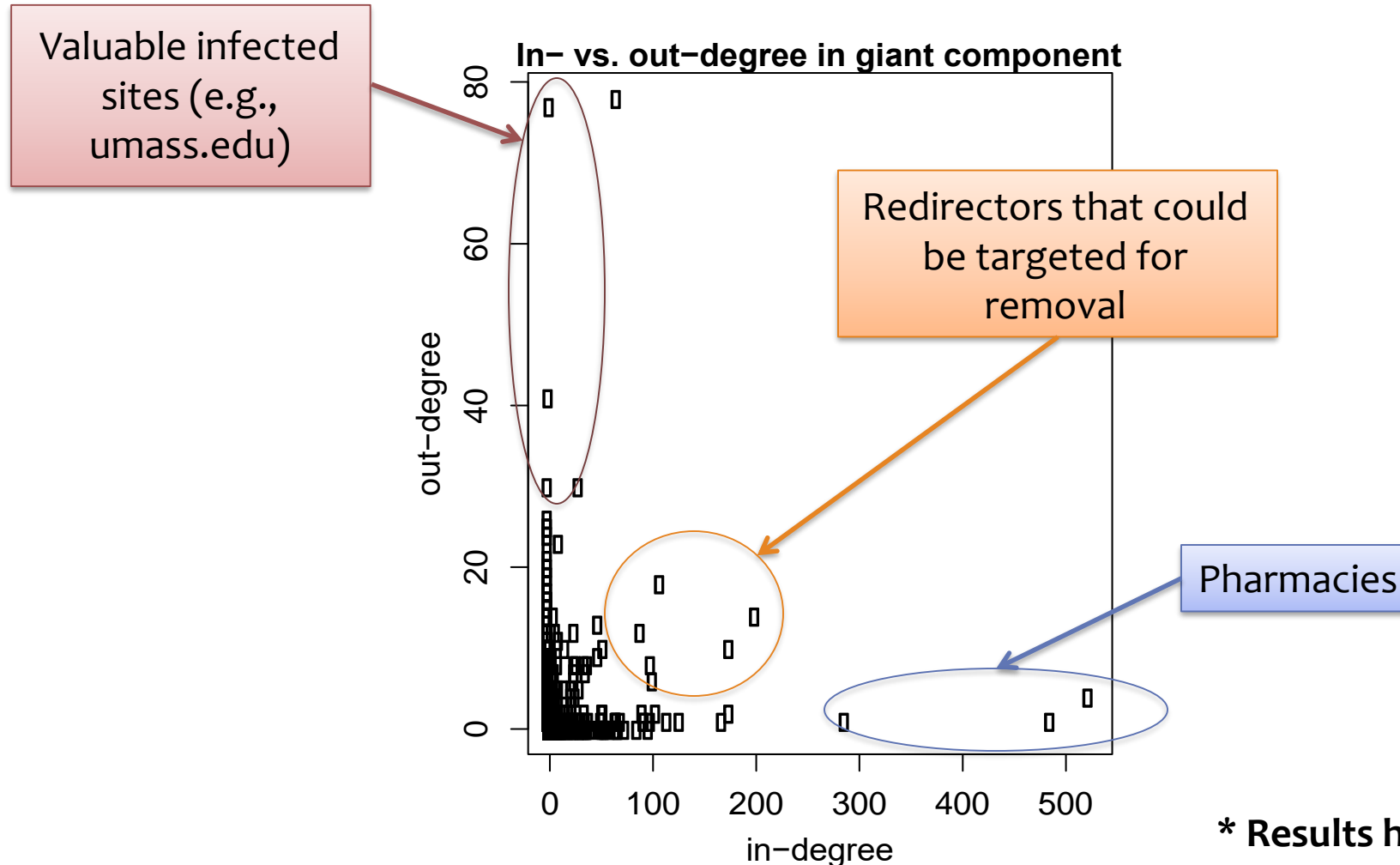
**B1, B2, B3 : Firefox, Safari, Chrome switch to HTTPS-only search**

**(C1,C2: major changes to our collection infrastructure)**

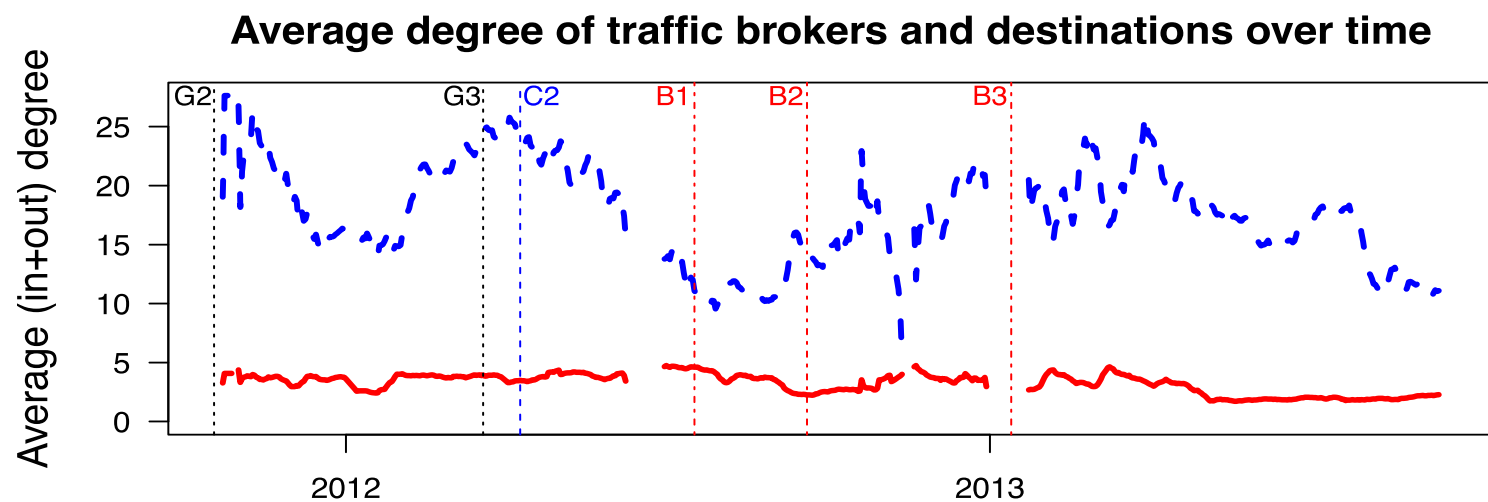
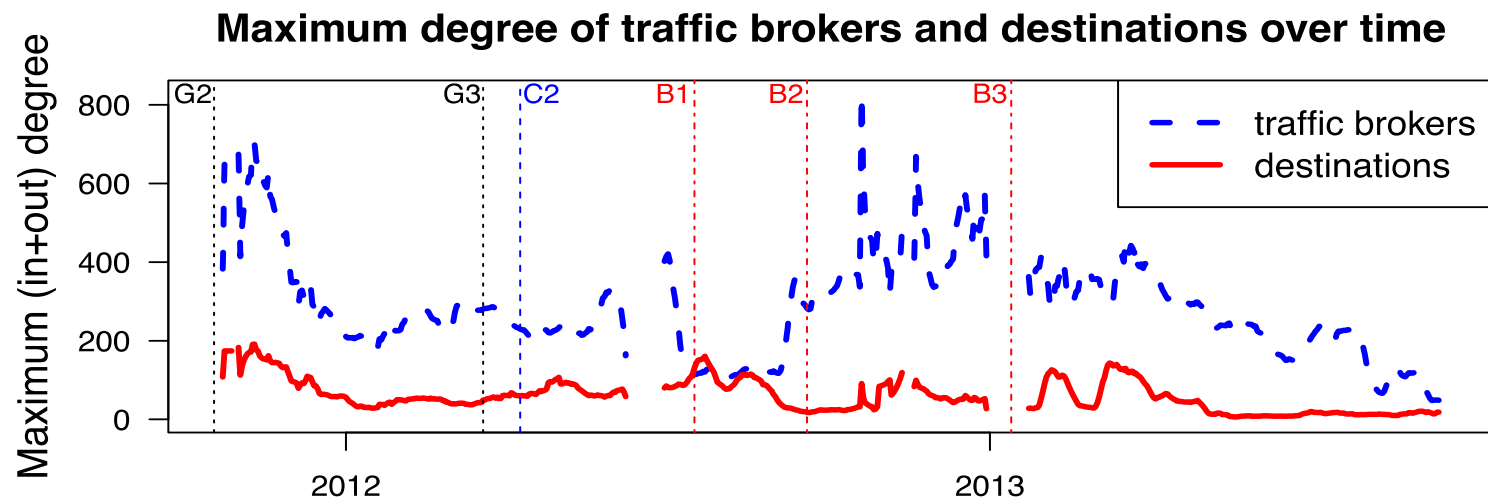
# Uncovering relationships in search results



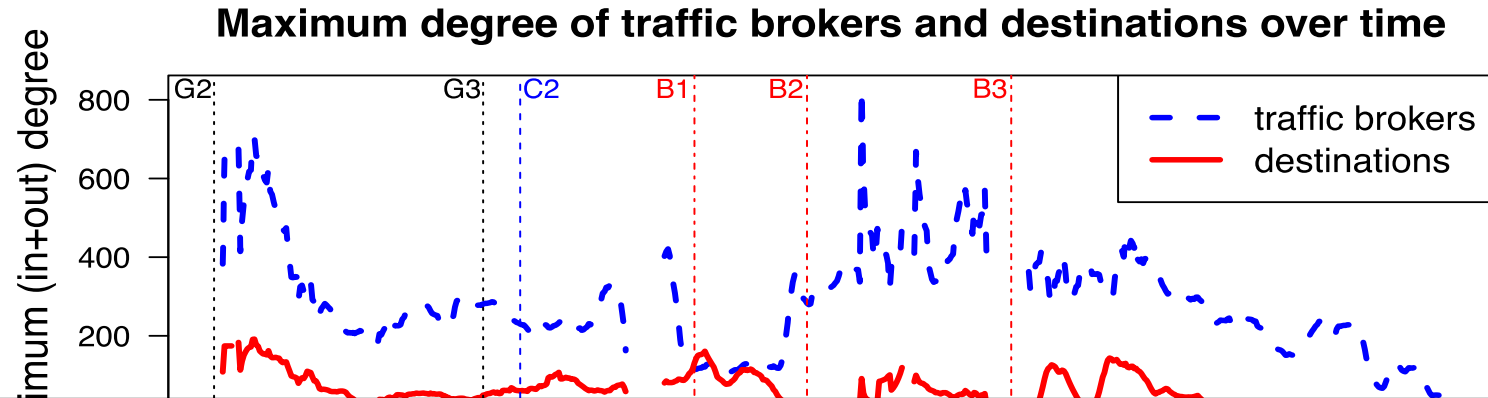
# Possible interventions (network side)



# Evolution in concentration (1)

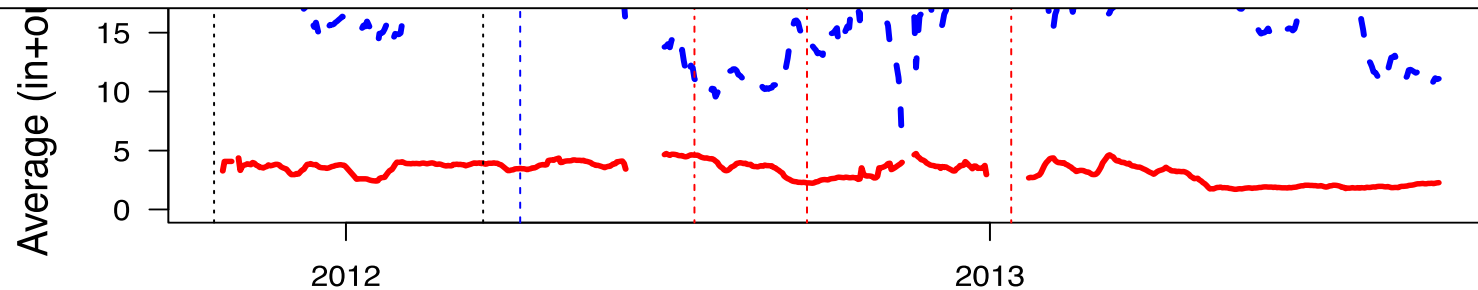


# Evolution in concentration (2)



Despite changes in the actual hosts used, the network structure has remained relatively stable over time

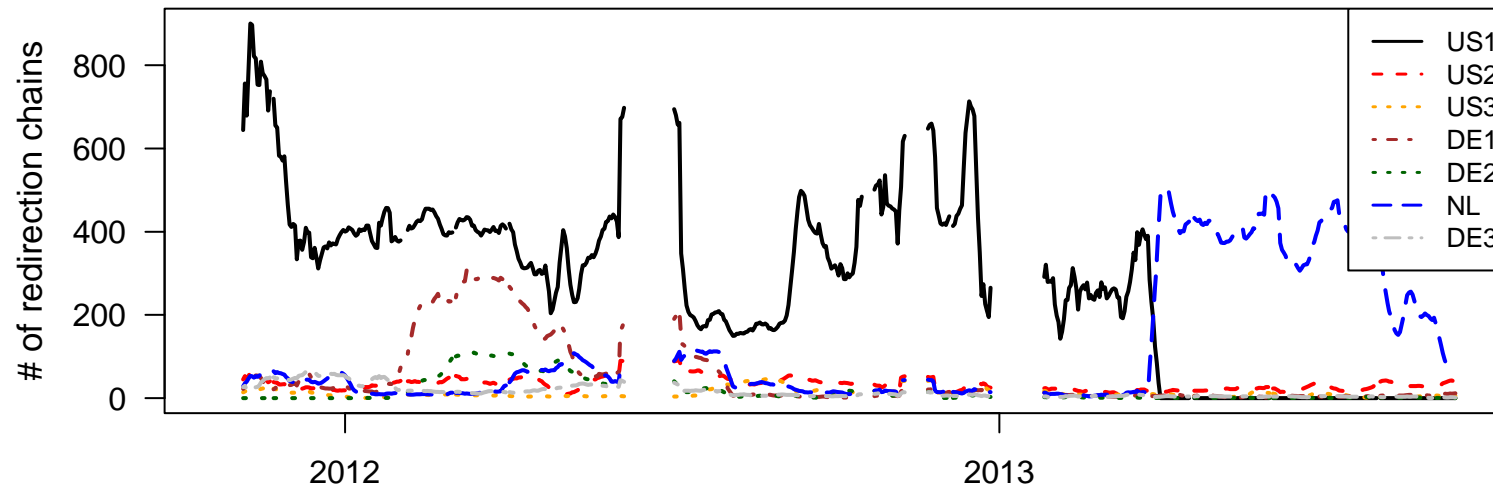
Large redirectors (traffic brokers) have only started to divest into smaller pieces in 2013



# Network infrastructure used by illicit advertisers

- Observed high concentration in traffic brokers
- Where are they located?

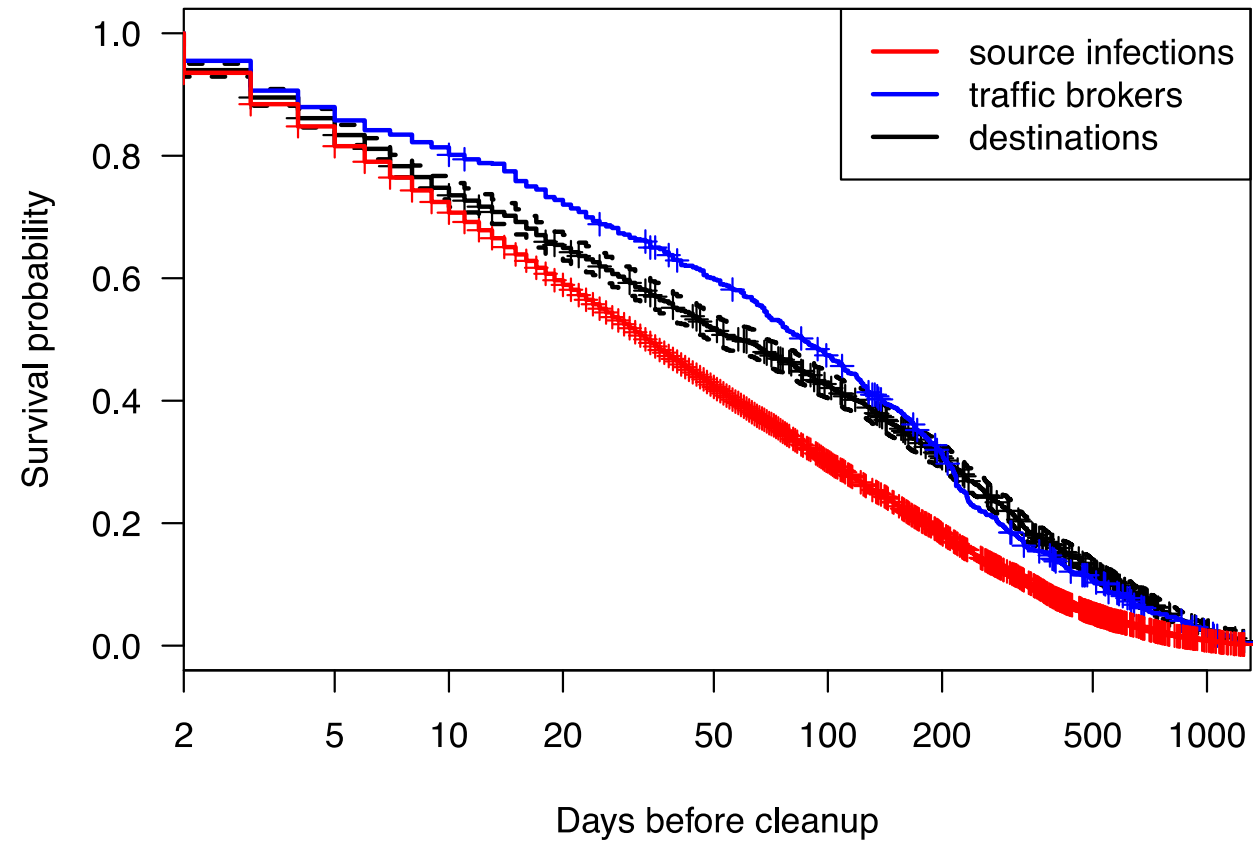
Traffic brokers observed each day grouped by AS



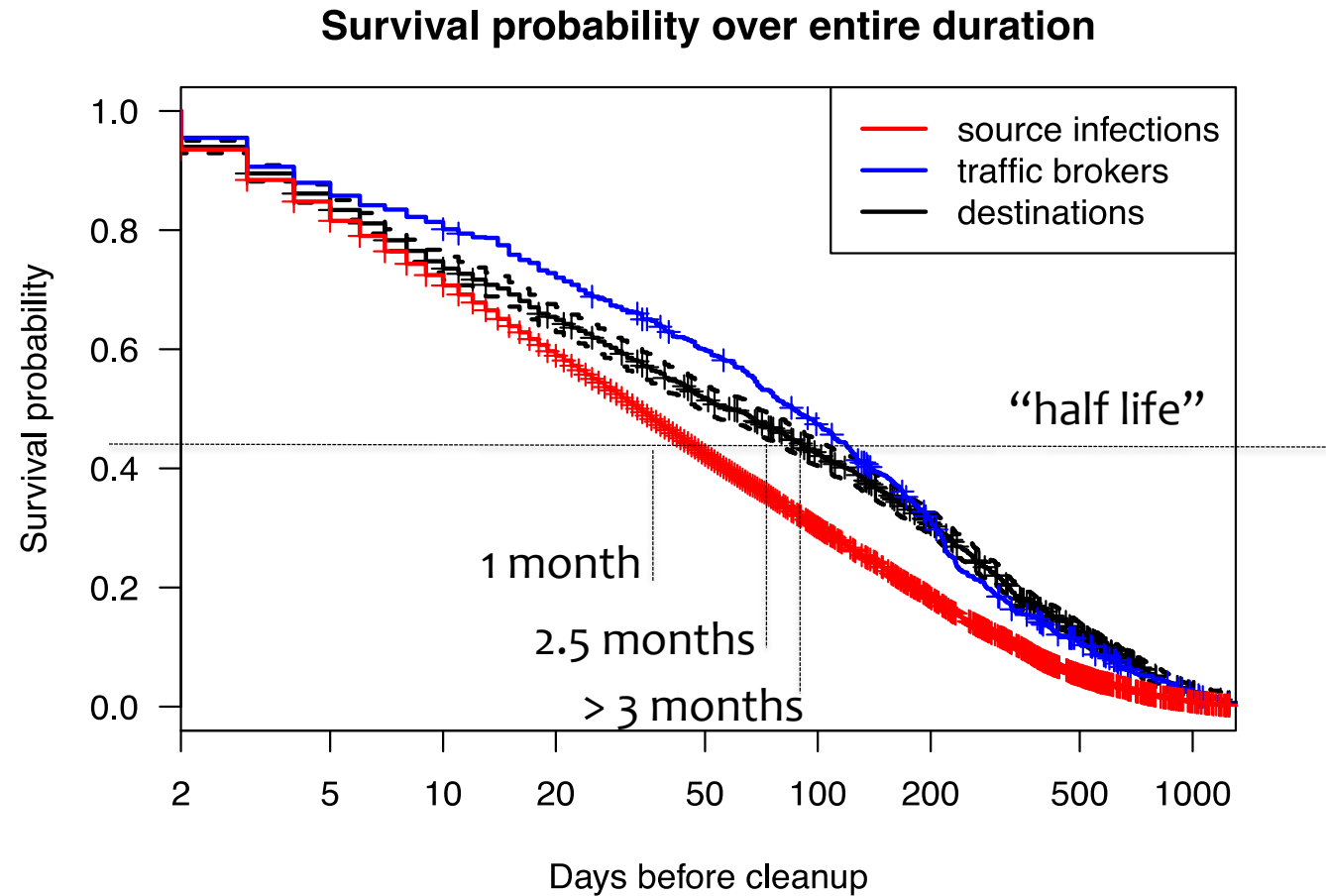


# Effects of clean-up efforts (1)

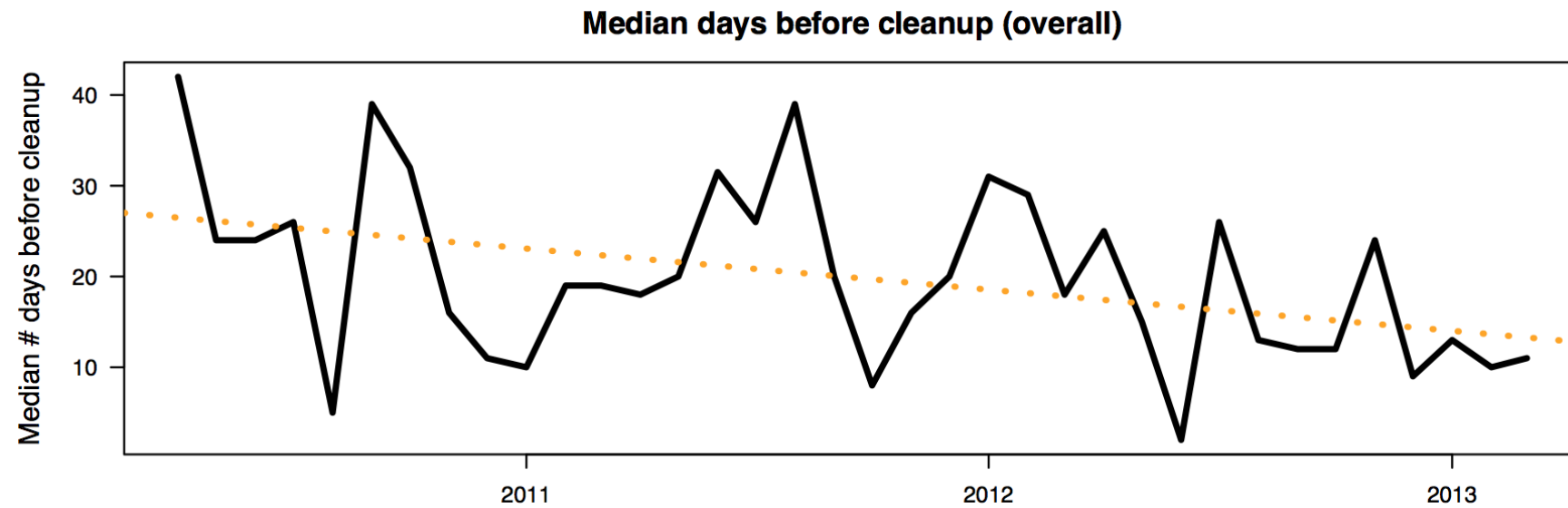
Survival probability over entire duration



# Effects of clean-up efforts (2)



# Effects of clean-up efforts (source infections over time)



# Summary of measurement findings

- **Search-result poisoning is here and has become a primary vector of advertisement**
- **Four-year longitudinal study shows**
  - ▼ Little sign of abatement despite opportunities
    - ▼ Large concentration in traffic brokers, especially AS-level
  - ▼ Adaptivity of attackers to countermeasures
  - ▼ Clean-up time decreased at end-hosts but still large (1 month on average, still ~2 weeks+ in 2013)

# Online criminal market place

## ■ A lot of dark market places

- ▼ Silk Road
- ▼ Agora
- ▼ Utopia
- ▼ TheRealDeal
- ▼ Alpha bay
- ▼ ...

## ■ Early adopters of technology

- ▼ Tor hidden service
- ▼ Bitcoin

# Silk Road—Beginning

- **Jan 1, 2011**

An unknown individual using the alias 'altoid' begins posting on internet forums shroomery.org and bitcointalk.org, advertising a hidden Tor service like an "anonymous amazon.com."

- **March 1, 2011**

Messages on Bitcoin Talk: Silk Road has been operational for 3 weeks

- **April 11, 2011**

Silk Road hits 1000 users

# Silk Road—Trails (1)

## ■ Oct. 11, 2011: Altoid Looks For a Bitcoin IT Pro

Bitcoin Talk user 'altoid' (alleged to be the same altoid who originally announced Silk Road's presence) posts a job ad for an "IT pro in the Bitcoin community" to work in a "venture-backed Bitcoin startup company". Interested parties are asked to write to "**rossulbricht at gmail dot com.**" Allegedly, this post links 'altoid' to Ross Ulbricht, putting him under the authorities' suspicion.

# Silk Road—Trails (2)

- **Feb. 5, 2012: Dread Pirate Roberts**

On Silk Road forums, user "Silk Road" announces "I need an identity separate from the site and the enterprise of which I am now only a part. I need a name. Drum roll please..... my new name is: Dread Pirate Roberts". This becomes the official forum mouthpiece for Silk Road.

- **Nov. 11, 2011: Dread Pirate Asks Stackoverflow For Tech Tips**

Someone creates an account on programming advice site StackOverflow.com with the name 'Ross Ulbricht' and email address **rossulbricht@gmail.com**.

- ▼ The curl script posted in the above Stack Overflow question is identical to code obtained from one of the Silk Road servers.



# Silk Road—The End

- **July 23, 2013**  
The FBI Gets An Image of The Silk Road Server
- **July 24, 2013—July 31, 2013**  
Homeland Security Confronts Ulbricht
- **Oct. 1, 2013**  
Ulbricht is Arrested
- **Oct. 2, 2013**  
Silk Road Seized By Law Enforcement  
Bitcoin value crashes  
Vendors arrested

# Silk Road—Subpoenas

- **A subpoena to Google provided information about the accountholder**
  - ▼ details of IP addresses used to log into Mr. Ulbricht's account (San Francisco, specifically an internet cafe on Laguna Street)
  - ▼ IP address is a VPN server
- **VPN server's records were obtained by FBI**
  - ▼ VPN server's records indicated a user had accessed it from a San Francisco Internet café near the home of a friend Ulbricht had gone to live with
- **The FBI Gets An Image of The Silk Road Server**
  - ▼ hosting provider at the request of the FBI via local authorities and the Mutual Legal Assistance Treaty.

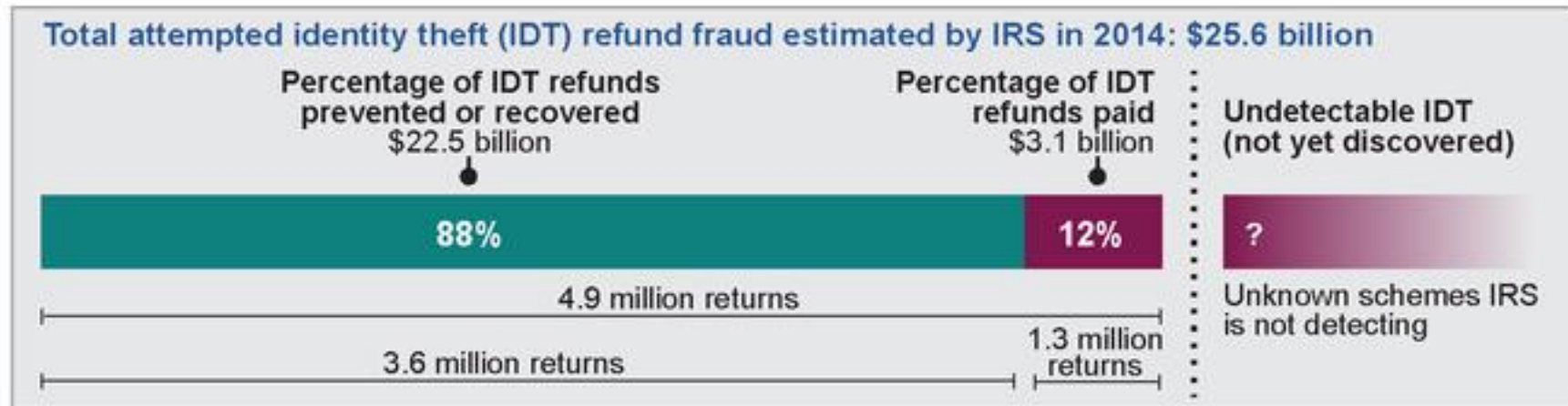
# Silk Road—Gaps?

- **FBI claimed it was because of a misconfiguration of the site's CAPTCHA, which inadvertently revealed Silk Road's IP address.**
  - ▼ Doubts about this claim
  - ▼ Someone claim the attack on Tor around the same time is related

# New approaches

## ■ Race to file tax returns

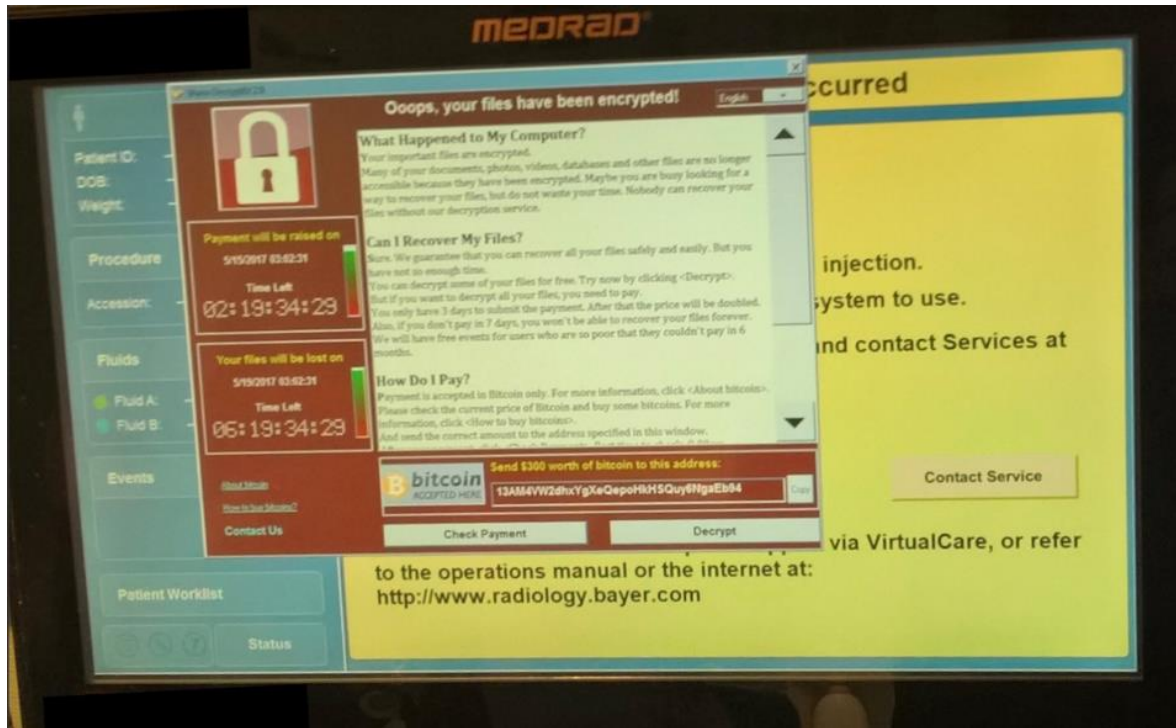
IRS Estimates of Attempted Identity Theft Refund Fraud, 2014



Source: GAO analysis of IRS data. | GAO-16-578T

# Ransomware

## ■ Possible reuse of intelligence agency tools



# More Ransomware

## ■ Colonial Pipeline Cyber Attack – May 7, 2021

- ▼ Paid \$4.4 million ransom
- ▼ Pipeline restarted after 5 days
- ▼ FBI recovered 63.7/75 bitcoins of ransom

## ■ Meat supplier JBS – June 2021

- ▼ Paid \$11M ransom

# Takeaway

## ■ Online crime is increasing in magnitude

- ▼ Search-redirection for online pharmacies:
  - ▼ top 12 clusters account for 2/3 activity
  - ▼ Few, large, traffic brokers
- ▼ Large number of participants perhaps induced by these “big shots”
  - ▼ This plays to the advantage of the defender!
  - ▼ Disrupt dependencies of the underground market

## ■ Darknets

- ▼ Use Tor hidden service
- ▼ Police manage to collect enough information to shut down many
- ▼ [Top Tor Darknet Links 2021 to Visit](#)

## ■ New approaches being created