Dirty Jobs — The Role of Freelance Labor in Web Service Abuse

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Vulnerability of Web Services

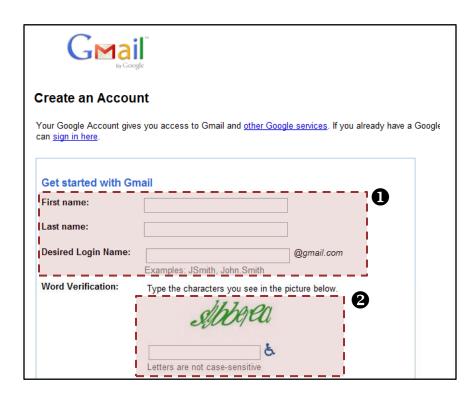
- Many Web services today are free/open access
 - Supported by advertising revenue
 - Reaching critical mass requires low barrier to entry
 - Page views driven by user-generated content
 - Videos, social networking updates, blogs, etc.
- However: openness leaves sites vulnerable
 - Exploitation of free resources
 - Ex: Sending spam from Web-based email accounts
 - Unsanctioned advertising channels
 - Ex: Spamming links on blog comments

Abuse Labor Markets

- Abuse is profitable
 - Kanich et al. estimated \$7k/day email spam revenue
 - Nontrivial to execute many schemes
- Labor markets have evolved to supply workers
 - One such labor market: online freelancing sites
- Why outsource abuse jobs?
 - Cost effective: workers originate from low wage regions
 - Agile: workers are adept and technically capable
 - Scale: ~one million workers on Freelancer.com

Ex: Account Registration

- Scenario: Abuser wants to send spam via Web email
- Prerequisite: Bulk accounts on Gmail



Gmail Fast Account Creator

<u>Gmail Fast Account Creator</u> is project number 359297 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

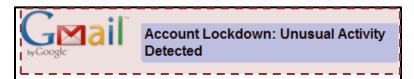
need gmail captcha codes entered

<u>need qmail captcha codes entered</u> is project number 452532 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

"i need gmail captcha entry agent immediately. 1000's new captcha entrys per week

Ex: Account Registration

- Problem: Google detects mass account creation
- Solution: Purchase IP proxy services



This account has been locked down due to unusual account activity. It may take up to 24 hours for you to regain access.

Unusual account activity includes, but is not limited to:

- Receiving, deleting, or downloading large amounts of mail via POP in a short period of time.
- Sending a large number of undeliverable messages (messages that bounce back).
- Using file-sharing or file-storage software, browser extensions, or third party software that automatically logs in to your account.
- 4. Leaving multiple instances of your Gmail account open.
- Browser-related issues. Please note that if you find your browser continually reloading while attempting to access your Inbox, it's probably a browser issue, and it may be necessary to clear your browser's cache and cookies.

Need software to hide IP, Proxy , Switch IP, Proxy

Need software to hide IP, Proxy, Switch IP, Proxy - HQ is project number 1063009 posted at Freelancer.com. Click here to post your own project.

Proxy - We Need THOUSANDS of USA Anonymous

<u>Proxy - We Need THOUSANDS of USA Anonymous Proxies</u> is project number 1098131 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

Proxy Need for Gmail & yahoo account Creating

<u>Proxy Need for Gmail & yahoo account Creating</u> is project number 445040 posted at Freelancer.com. Click here to post your own project.

Ex: Account Registration

- Problem: Google implements phone verification
- Solution: Buy telephone numbers



Need U.S. Based Phone Numbers For PVA Verification

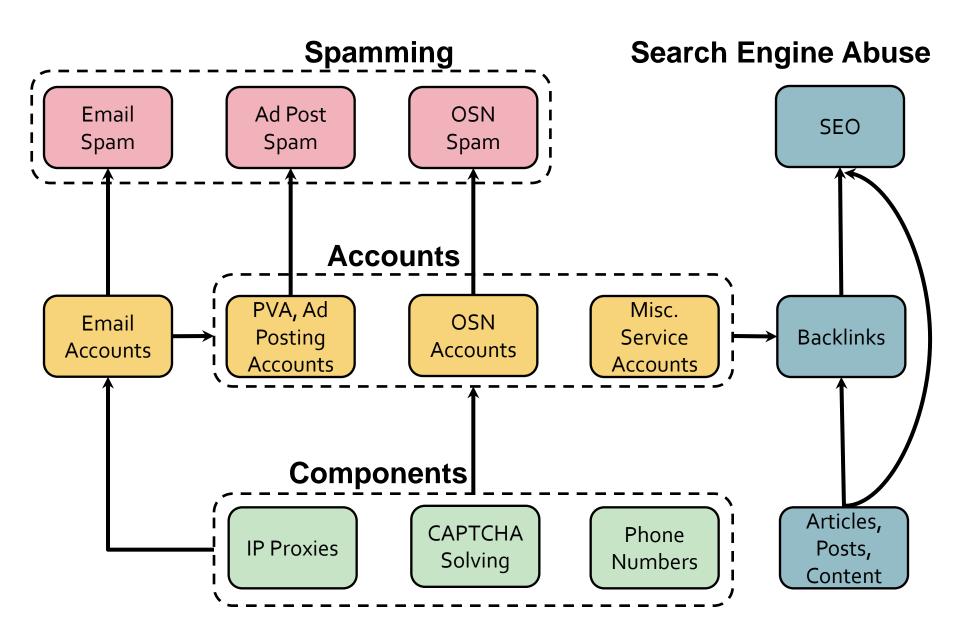
Need U.S. Based Phone Numbers For PVA Verification is project number 613869 posted at Freelancer.com. Click here to post your own project.

100 DID Forwarding Numbers for PVA Creation

100 DID Forwarding Numbers for PVA Creation is project number 484506 posted at Freelancer.com. Click here to post your own project.

1K Phone Activated Gmail Accounts Wanted

1K Phone Activated Gmail Accounts Wanted is project number 565733 posted at Freelancer.com. Click here to post your own project.



Overview

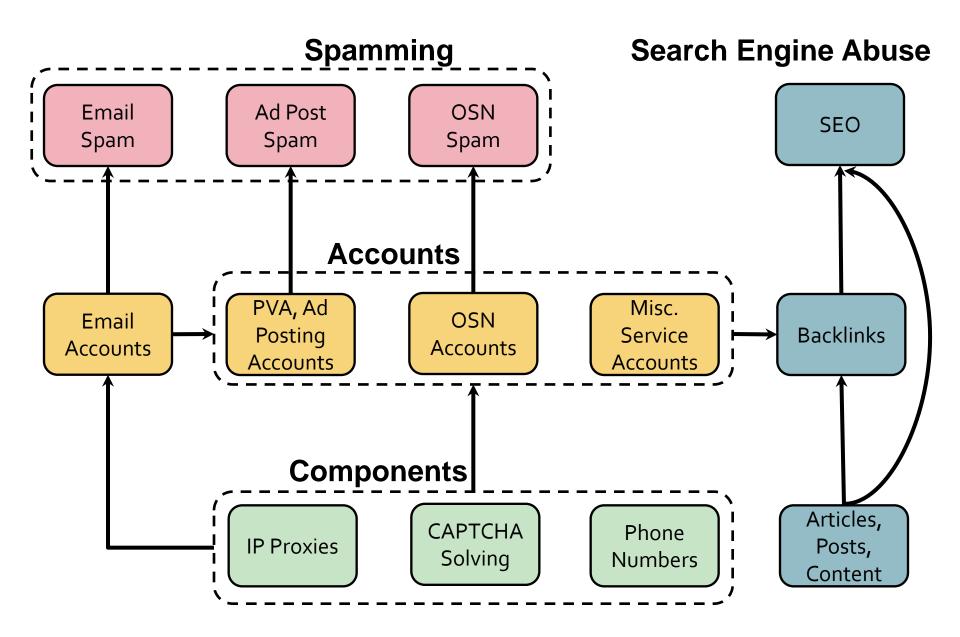
- Goal: Assess the role of freelance labor in supporting Web abuse by investigating...
 - Types of services currently available
 - Demand for various jobs
 - Cost of each abuse task
 - Quality of the delivered work
- Approach:
 - Characterize job postings on Freelancer.com
 - Post jobs and hire workers

Freelancer.com Background

- Freelancer.com: one of the largest outsourcing and oldest freelancing sites
 - Claims over two million employers and workers
 - User population covers 234 countries/regions
 - Exports API to query info on users and jobs
- How it works:
 - Buyers/employers post jobs
 - 2. Workers bid on jobs
 - 3. Buyers select workers

Methodology

- Obtained seven years worth of job/user data:
 - 840 k job descriptions
 - 815 k user profiles
 - 12 million bids
- Categorizing dataset:
 - Of 2k manually labeled jobs: <u>~30% abusive</u>
 - Beyond 2k jobs: trained SVM classifiers for 9 job types
- Posted jobs to test quality/delivery of products



Accounts Registration Jobs

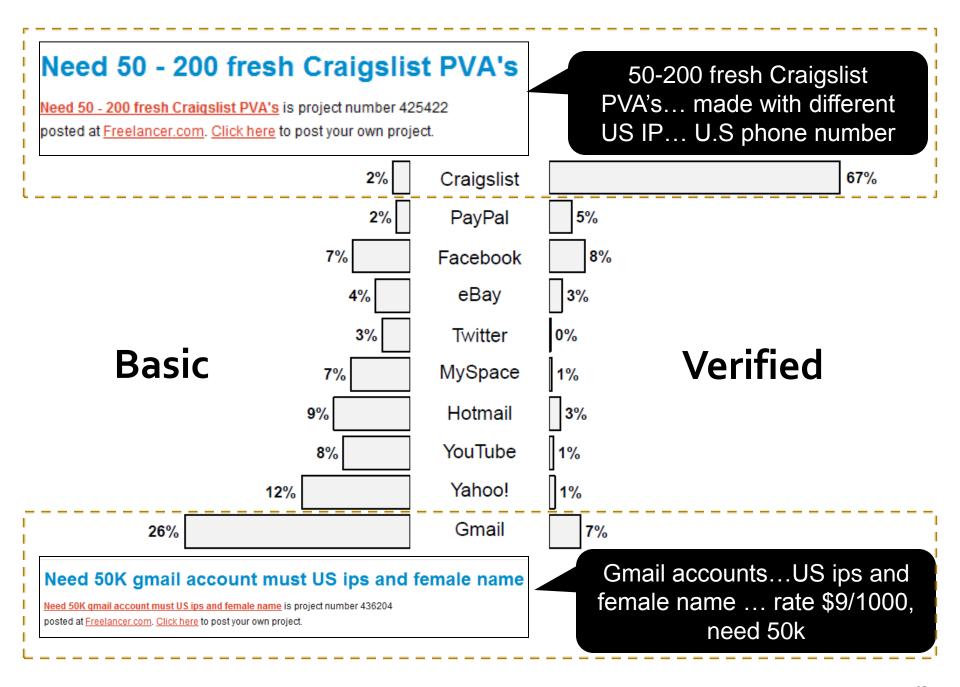
- Many abuse schemes require accounts
 - To scale abuse, need large quantity

Basic Accounts:

- Requirements: CAPTCHA solve, IP diversity
 - Examples: Plain Gmail, Hotmail, Facebook

Verified Accounts:

- Requirements: Phone numbers, credit cards, etc.
 - Examples: Craigslist PVA, Ebay Verified Seller



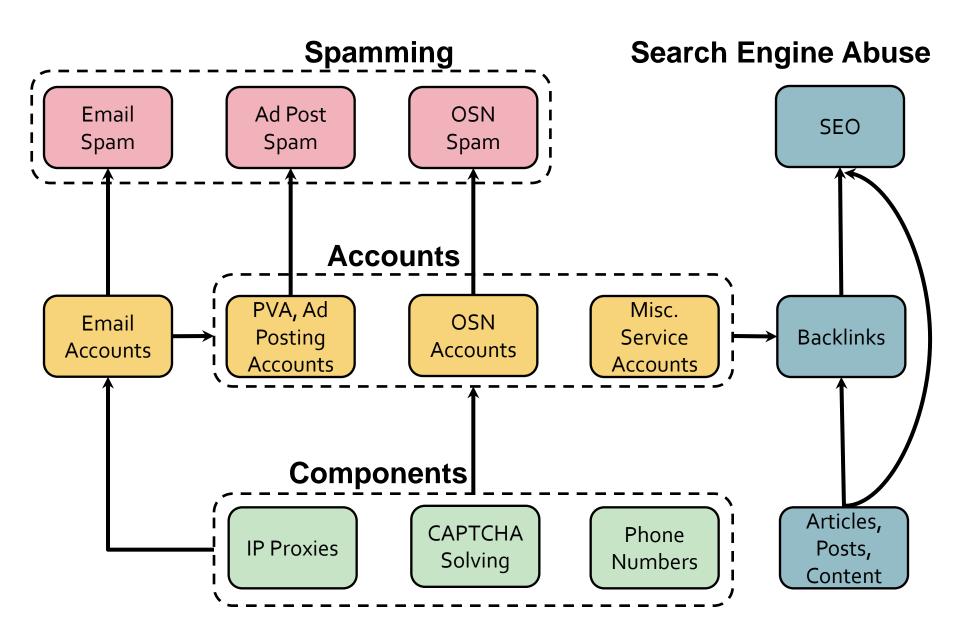
Worker Engagement: Accounts

Can workers deliver valid, bulk, web-based email accounts?

Name	Rating	Tested	Valid (%)	Age (Days)
IN ₁ *	9.8	500	100.0	0.4
UK ₁	9.9	3,500	99.9	25.7
BD_1	10	6,999	99.6	24.7
IN_2	9.8	5,015	99.6	9.7
PK_1	10	4,999	99.4	78.6
PK_2	9.8	4,000	95.4	82.6
PK ₃	9.9	4,013	77.3	414.7
IN_3	9.9	6,200	76.2	30.7
${\tt CA_1}^{**}$	9.6	508	15.7	21.7

Used Inboxes

Facebook Craigslist Facebook Re: Looking for a real female that is real and down to earth and fun.. Thomas, your friends from curly wurly are waiting for you Facebook Re: MM for Female - m4w (Morristown/Rogersville) Thomas, you have notifications pending Facebook Re: MARRIED 4 MARRIED - m4w - 34 (long island) wants to be friends on Facebook. Facebook Re: MARRIED 4 MARRIED - m4w - 34 (long island) confirmed you as a friend on Facebook... Facebook Re: Looking for a life experience - m4w - 23 confirmed you as a friend on Facebook... Facebook wants to be friends on Facebook.

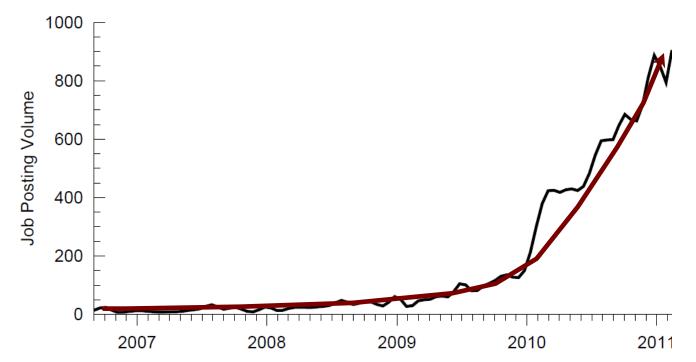


Spamming Web Services

- Online Ad Postings: Jobs to post daily advertisements to Craiglist, Kijiji, etc.
- Bulk Emailing: Jobs to send bulk emails
- Online Social Network Linking: Jobs that involve creating social links to users

OSN Linking

- Buying friends, Facebook fans/likes for website pages, Twitter followers, YouTube subscribers, etc.
- Trend: Surging rise in demand



Example: OSN Linking Job

Need Fans Added to my Facebook!!!

Need Fans Added to my Facebook!!! is project number 599817 posted at Freelancer.com. Click here to post your own project.

I need to build up my fan base on Facebook for my musician page... Here is link to my page...



Example: OSN Linking Job

Facebook Fans Required (4,000) - Real working fans.

<u>Facebook Fans Required (4,000) - Real working fans.</u> is project number 1058372 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

I'd also like to know your plan for converting people into buyers and monetizing the page...





Target Characteristics

- Facebook, MySpace, Twitter, and YouTube mentioned in 97% of jobs
- Targeted demographics: High-income English speaking countries
 - US (46%), UK (13.2%), Canada (9.5%), AU(6.2%)
- Employers want real users:
 - Over 50% of jobs included "real" and "active"

Worker Engagement: OSN Links

- Can workers deliver quality social links?
- Task: Acquire 1k links for a skin care site
 - Target real people based in US, UK, and Canada



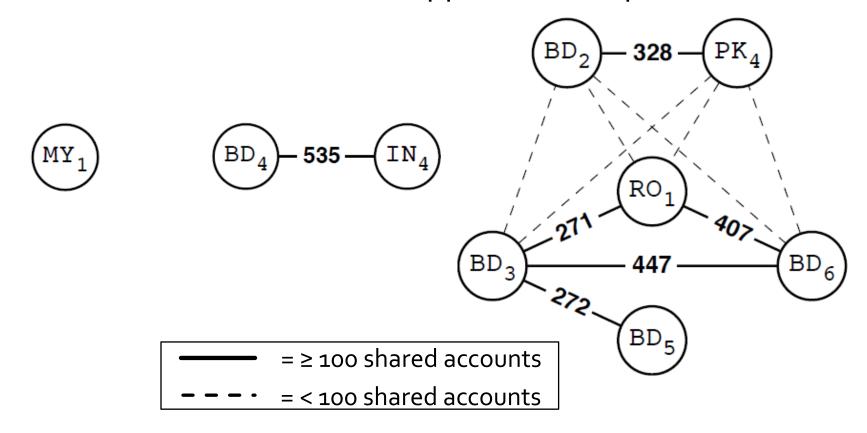
Result of Purchasing Links

 Overview: Of the 10 workers selected, only 1 delivered "quality" links

			Top	Top Countries (%)			
Name	Rating	Links	US	IN	BD	PH	
BD_2	9.8	1,034	26.2	13.8	5.9	7.7	
BD_3	9.8	1,081	43.3	7.4	32.5	4.4	
BD_4	8.4	1,063	74.5	0.3	25.2	_	
BD_5	10	1,071	_	—	100	_	
BD_6	10	1,145	60.0	8.7	8.4	5.3	
BD ₇ *	9.8	555	30.6	10.4	10.6	8.4	
IN_4	9.9	1,095	64.3	25.1	10.5		
MY ₁	9.8	1,110	99.1	_		0.1	
PK ₄	_	1,015	24.7	9.2	5.9	7.0	
RO_1	10	1,058	31.8	11.0	8.8	8.4	

Determining User "Realness"

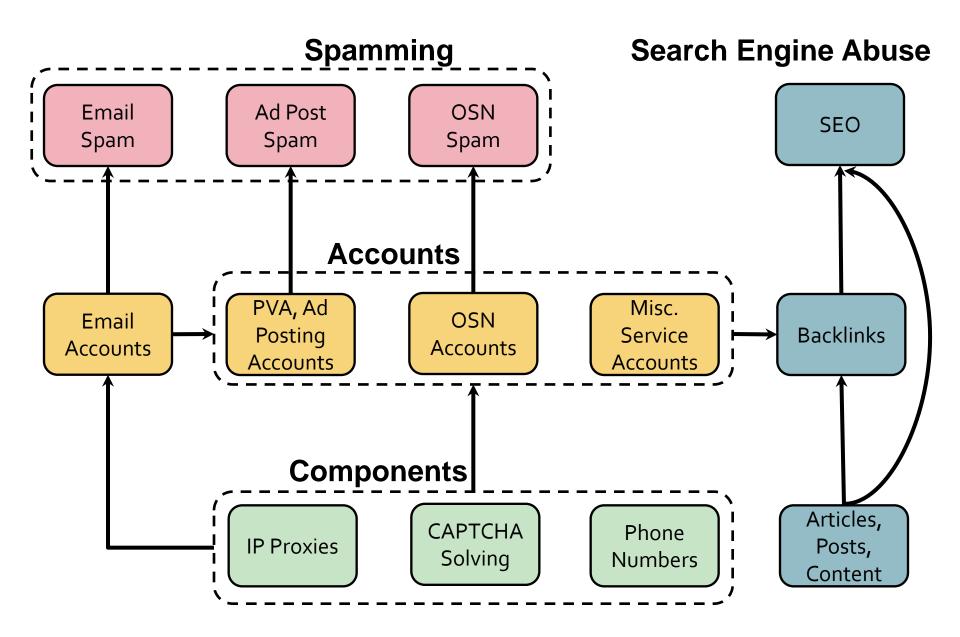
- Goal: Assess if page links come from real users
 - Observation: Same users appear in multiple sets



"Realness" of Delivered Users

 Users are fake: few friends, substantial number of links to other websites

MY, delivered real, unsuspecting users **Madden Scott** # Friends: 0 # Page Links: ~1,085 Eew F lan Few Fr Arthur Santos # Friends: 11 200 Few Pa # Page Links: ~32 About me: **Mia Windly** I am an honest Man ...I # Friends: 70 am a single mom of 2 girls # Page Links: ~3,845 and it is not easy...I am a 300 600 900 hot latina, LMAO!!! Median Page Links



SEO Backlink Purchasing

- Goal: Drive traffic to target website by gaming search engine algorithms
- Background (Google):
 - Backlinks: Incoming links to target website
 - Site's PageRank score based on backlink quality
- Scheme: Acquire large quantities of backlinks, either by spamming or purchasing

Backlink Job Classes

Yahoo QA + Blog Commenting + Link Building Project

<u>Yahoo QA + Blog Commenting + Link Building Project</u> is project number 1011018 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

- Need someone with <u>Level-2 Yahoo accounts</u> who can post Q&A... will provide with live/click-able link to my website. I will pay <u>20 cents</u> each.
- I need links for Relevant Blogs for product I am selling ...recommend my product and post a link to my website
- "Greyhat": Spamming forums, blogs, social bookmarking sites with backlinks

Backlink Job Classes

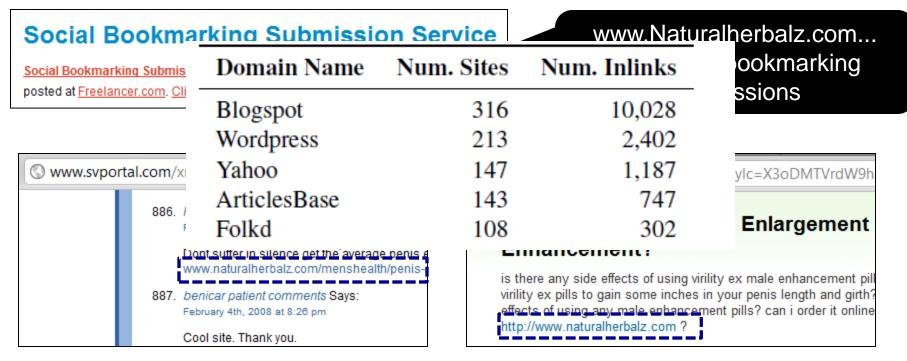
Need 1000 backlinks from PR4+ sites

Need 1000 backlinks from PR4+ sites is project number 1143598 posted at Freelancer.com. Click here to post your own project.

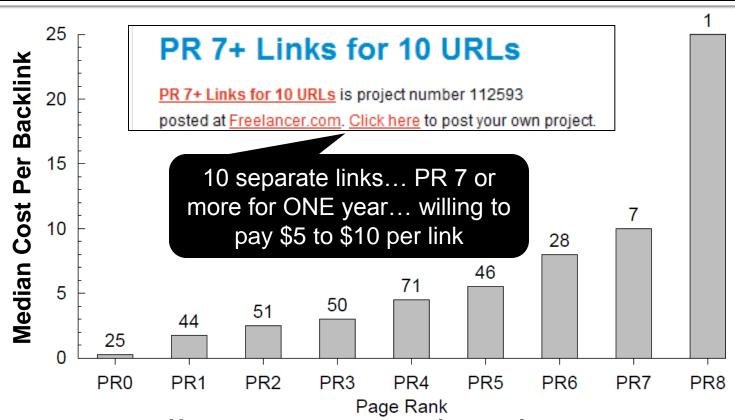
- No classifieds or mortgage, gaming, web directories...
- No article directories, forums...
- No link farms, no link-exchange programs...
- No exchange programs, web rings...
- No gambling, adult & porn sites, pharmacy sites....
- "Greyhat": Spamming forums, blogs, social bookmarking sites with backlinks
- "Whitehat": Explicitly forbids abusive techniques, but specifies PR of sites to purchase from

"Greyhat" SEO: Spammed Sites

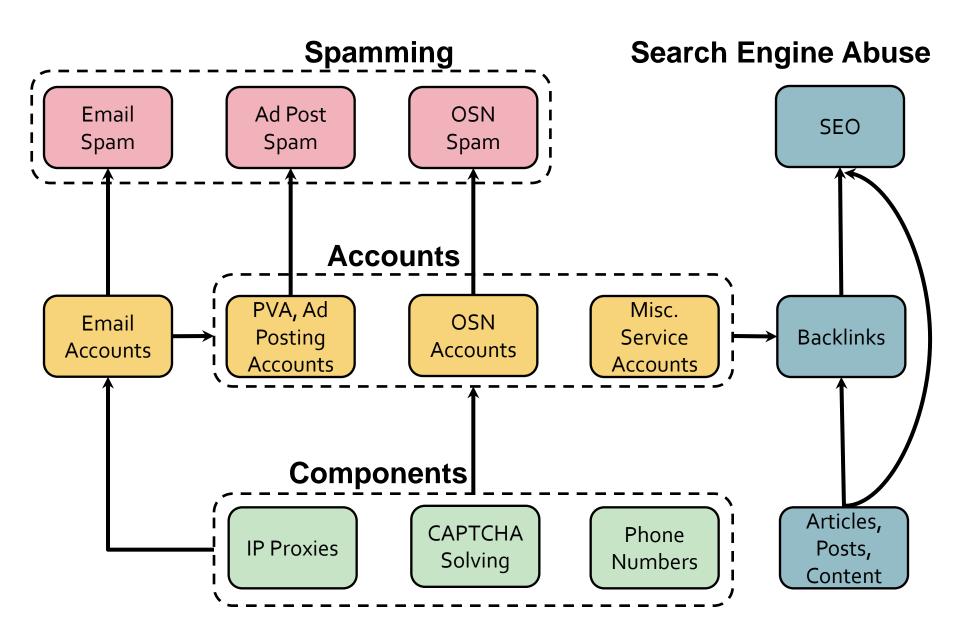
- Objective: Determine sites targeted for backlink abuse
- Methodology: Extract target URLs from job posts and use Yahoo Site Explorer API to find backlinks



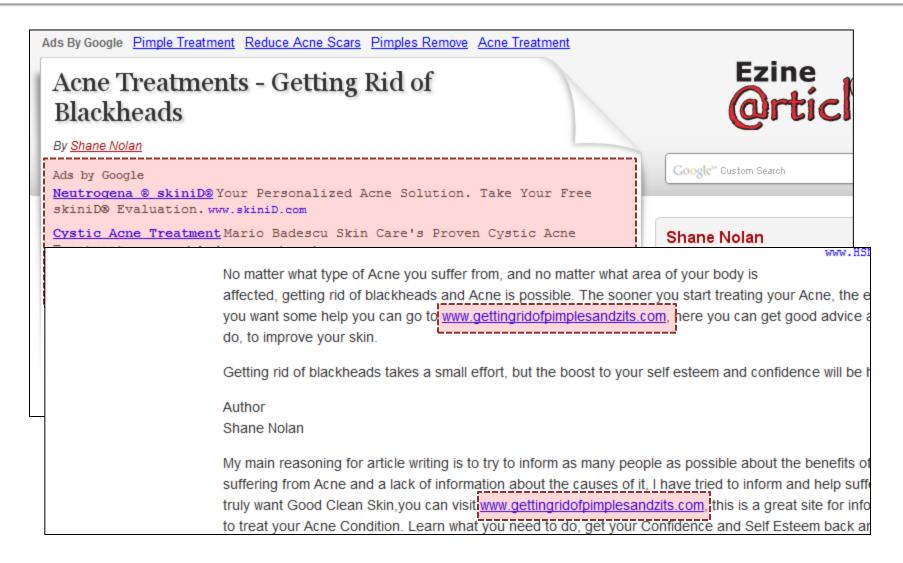
"Whitehat" SEO: Backlink Pricing



 Buyers willing to pay workers between \$0.50 and \$25 for backlinks depending on PR of site



Search Engine-Oriented Content



SEO Content Jobs

\$30 for 15 400-600 word articles

§30 for 15 400-600 word articles is project number 1116487 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

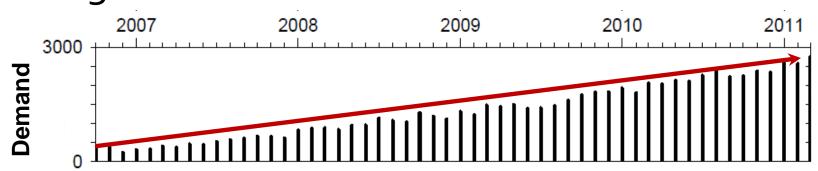
Given 10 keywords to write 1 articles about each...good keyword density...

Spintax ready articles (eg: {Hello|Hi|Hey})

<u>Spintax ready articles (eq: {Hello|Hi|Hey})</u> is project number 1078208 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

Spinning in format {a|b|c|d}...
4 combinations average in brackets

Largest abuse class in dataset:



Worker Engagement: SEO Content

- Can workers deliver quality SEO content?
- Methodology:
 - Commissioned article writing task to 10 workers
 - Passes CopyScape, plagiarism detection tool
 - Keyword density (KD): 2-3%
 - Six article topics revolve around skin care (Antiwrinkle creams, acne cleansing, etc.)

Quality of Articles

"Conjugated linoleic acids revitalizes the skin's rebirth while decreasing the emergence of lines."

-Flesch-Kincaid grade level of 11

"A wrinkled face destroys the confidence of a person specially that of a woman. She becomes a subject of gossip."

- Flesch-Kincaid grade level of 6

Summary

- Attackers outsource number of abuse jobs:
 - ~30% of Freelancer.com jobs abusive
 - Jobs spanned range of categories, from spamming, to account registrations, to SEO
- Engagement with workers showed:
 - Workers complete jobs
 - Quality of delivered product is highly variable

Conclusion

- Large, cheap labor pool changes threat model
 - Automation is not the only way
 - Largely removes difficulty in executing abuse task
- Outsourced workforce enables new attacks
 - Workforce is flexible, adapts to meet demand
 - Abusers innovate by trying different schemes
- Identification of abuse jobs is possible
 - Web services: acquire insight into abuse techniques
 - Freelance sites: filter abuse jobs to disrupt ecosystem

Questions?

CAPTCHA Solving

- Overview: Using humans to solve CAPTCHAs
- Employers post daily ads on Freelancer.com:

Captcha typing. Need night shift support.

<u>Captcha typing. Need night shift support.</u> is project number 1078589 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

Nightshift support on following servers: Qlink, Goodearners, Fasttypers, Mars dooms.

Data entry operators for captcha work

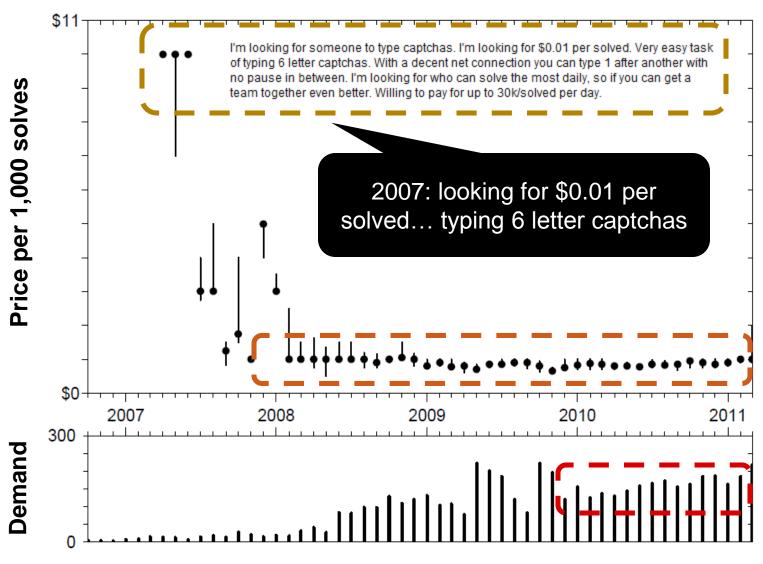
<u>Data entry operators for captcha work</u> is project number 1103100 posted at <u>Freelancer.com</u>. <u>Click here</u> to post your own project.

Rate is.80\$-.85\$ per 1k ... Bangladeshi workers are preferable

Big Captcha Team needed 24/7

Biq Captcha Team needed 24/7 is project number 1112199 posted at Freelancer.com. Click here to post your own project.

3000-4000 output per hour ... image is yahoo captcha



- CAPTCHA solving began at nearly \$10/1,000 solves
- Price stabilized to roughly \$1/1,000 solves
- Demand has remained stable since 2010