cisco



When threat hunting fails

Identifying malvertising domains using lexical clustering

Tucson, January 9th, 2018

Authors



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Agenda

Background

Ad Network Profiling and Filtering

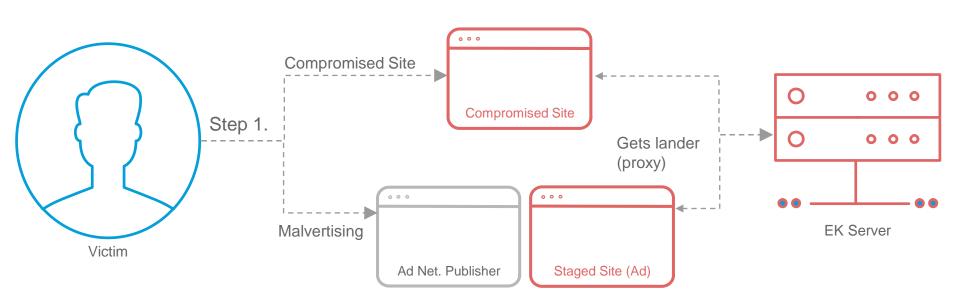
Lexical Clustering

Hosting space and top talkers

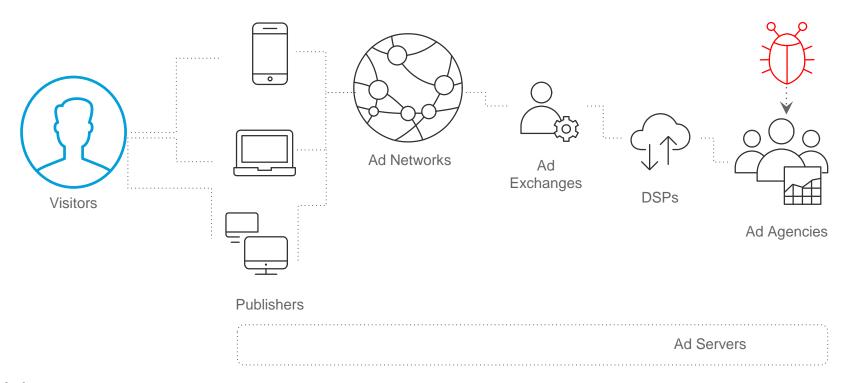
Background

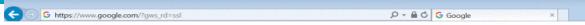


Exploit Kits



What is Malvertising





About Store

Gmail Images

Sign in



Your security matters

Google recommends using Chrome, a fast and secure browser. Try it?

NO, NOT INTERESTED



Google Search

I'm Feeling Lucky

Advertising Business













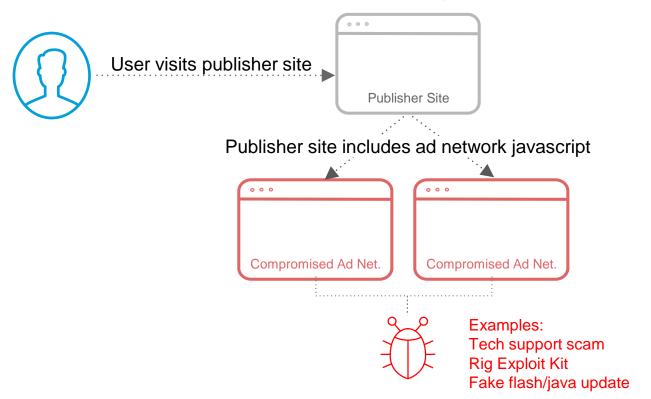


Privacy



Settings

Ad Campaign Flow



Ad network fingerprints and sends user to malvertisement

Exploit Kits Filter Filter Filter Filter

Date/Time	Dst	роп	Host	Info
2017-06-20 14:28:04	80.77.82.41	80	observice.info	GET /banners/uaps HTTP/1.1
2017-06-20 14:28:04	80.85.158.121	80	80.85.158.121	POST /?Reg&man=1617&van=xHrQMrPYbR3FFYbfKP_EUKFEMUvWAOSKwYyZhazVF5qxFDTGpbH
2017-06-20 14:28:06	80.85.158.121	80	80.85.158.121	GET /?ele&flight=4546&man=4796&van=xX3QMvWYbRXQCJ3EKv_cT6NGMVHRGUCL2YydmrHVe
2017-06-20 14:28:07	80.85.158.121	80	80.85.158.121	GET /?Mon&flight=3807&traveling=K3jxOALQFozYdZB1xF9Pj7jELUyx-e1ZbX-UPfYQ5Hrs
2017-06-20 14:28:13	80.77.82.41	80	observice.info	GET /banners/uaps HTTP/1.1
2017-06-20 14:28:14	80.85.158.121	80	80.85.158.121	POST /?vel&man=2874&traveling=SwZmnIwOAF5A9K2r20KEnBTI1JWG9RaPaAlG-pbBE7I52F
2017-06-20 14:28:16	80.85.158.121	80	80.85.158.121	GET /?Reg&man=163&traveling=ThiRbSKAFimdtfAw9H9P2qhkLXwBWfhcOF_heNYwlG-8CRRu
2017-06-20 14:28:17	80.85.158.121	80	80.85.158.121	GET /?Mon&flight=3532&man=3839&traveling=ThjxbSKAZimdtfAw9H8_2qhkPXwBWYhcOF_
2017-06-20 14:29:02	47.91.121.220	80	multifest.bit	POST / HTTP/1.0
2017-06-20 14:29:05	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:07	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:11	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:14	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:16	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:20	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:24	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:27	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:29	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:29:40	47.91.121.220	80	multifest.bit	POST /com/ HTTP/1.0
2017-06-20 14:30:04	47.91.121.220	80	multifest.bit	POST / HTTP/1.0

'llulu Cisco Umbrella



Call On Our 1

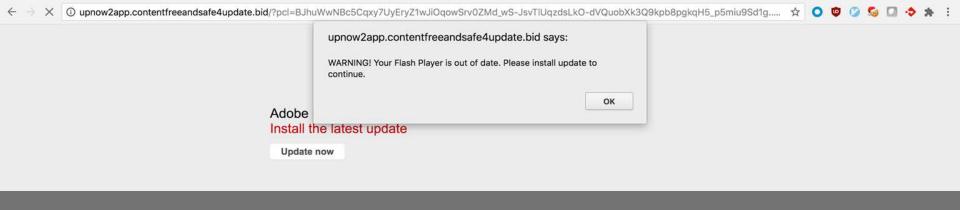
United States

Hello from Seattle.

) 584-6326

Site Map

Microsoft © 2016 Microsoft



Fake Flash and Java Updates

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By downloading, you accept our TOS and Privacy Policy.

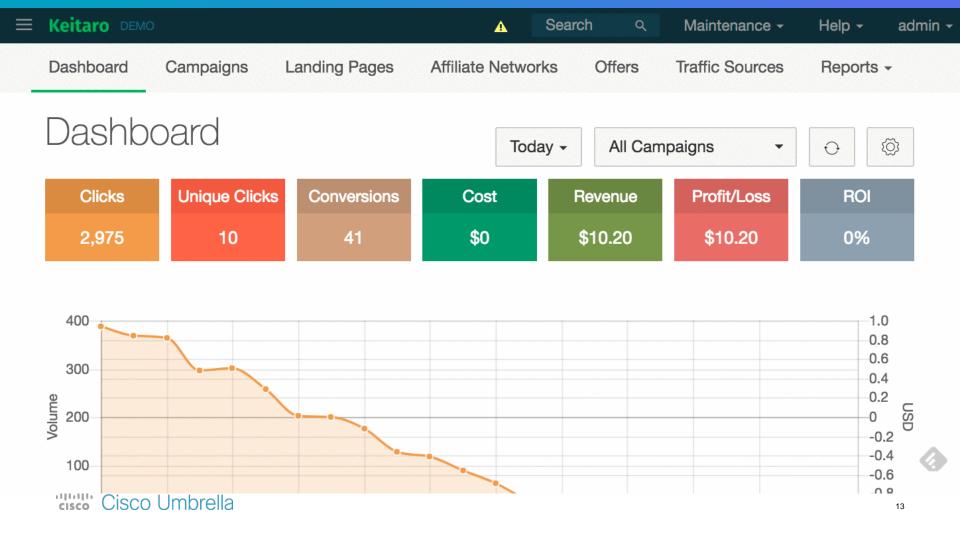
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Ad Network Profiling and Filtering

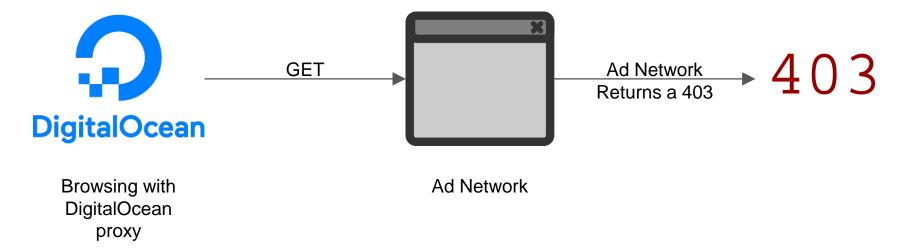




Proxy Network

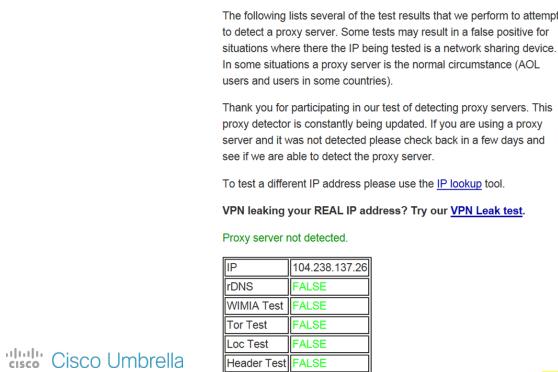


Filtering on non-residential IP Address



Attempts with other VPS providers





Server

squidproxy

512 MB Server - 104.238.137.26

f 815 ♥ 🖶 🔽 👂 M 🛨 The following lists several of the test results that we perform to attempt

Advanced Proxy Check

Thank you for participating in our test of detecting proxy servers. This proxy detector is constantly being updated. If you are using a proxy

OS

Location

Miami

Charges

\$1.33

Status

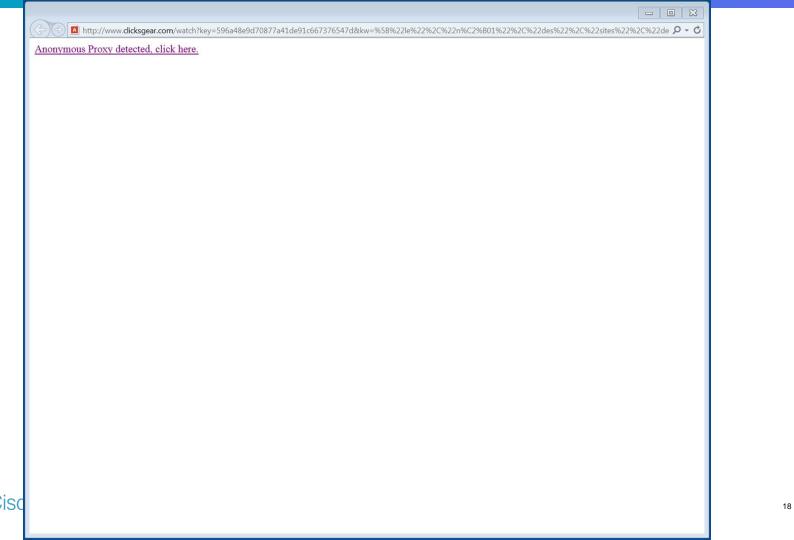
Running

To test a different IP address please use the IP lookup tool.

VPN leaking your REAL IP address? Try our VPN Leak test.

DNSBL Test FALSE









ADSTERRA ADVERTISEMENT

YOU ARE SEEING THIS PAGE, BECAUSE YOU ARE USING AN ANONYMOUS PROXY.

IN ORDER TO PROTECT OUR ADVERTISERS, WE DO NOT DISPLAY

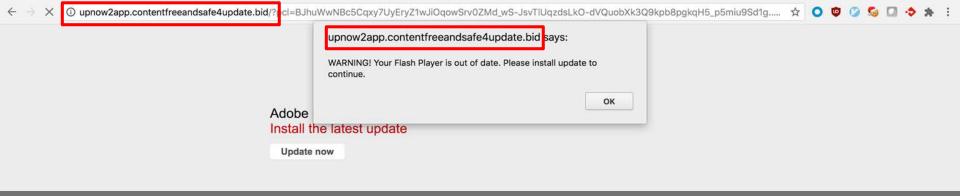
REAL ADS TO THE WEBSITES OWNERS. THE REAL ADS WILL BE DISPLAYED TO YOUR REGULAR TRAFFIC AND WILL BE PAID.

Lexical Clustering



Attention to Details





Fake Flash and Java Updates

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This site and the download manager have no relationship with the author. Any third party products,



SEARCH PATTERN SEARCH BULK EDIT

contentfreeandsafe.*

0

INVESTIGATE

Constrain RegEx search to Last 30 days \$

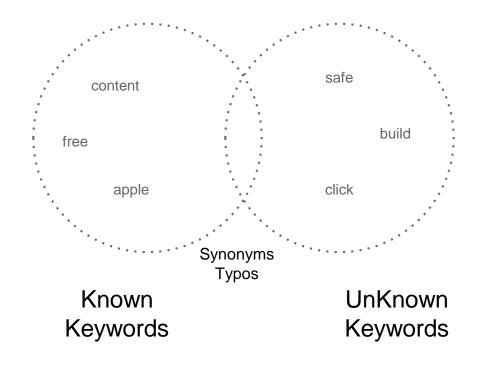
Showing 460 results for contentfreeandsafe.*

Domain Name	Security Categ	First Seen
contentfreeandsafe2updating.stream	Newly Seen Do	December 13, 2017, 3:17pm
contentfreeandsafetoupdating.review	Newly Seen Do	December 13, 2017, 3:09pm
contentfreeandsafe4updating.date	Newly Seen Do	December 13, 2017, 3:00pm
contentfreeandsafeupdatesgreat.win	Newly Seen Do	December 13, 2017, 2:18pm
contentfreeandsafeupdatingnew.win		December 13, 2017, 11:27am
contentfreeandsafetoupgrade.stream		December 13, 2017, 11:16am
contentfreeandsafe4upgrading.download		December 13, 2017, 10:39am

More or Less Traveled Roads



Consider the almighty RegeX Keywords

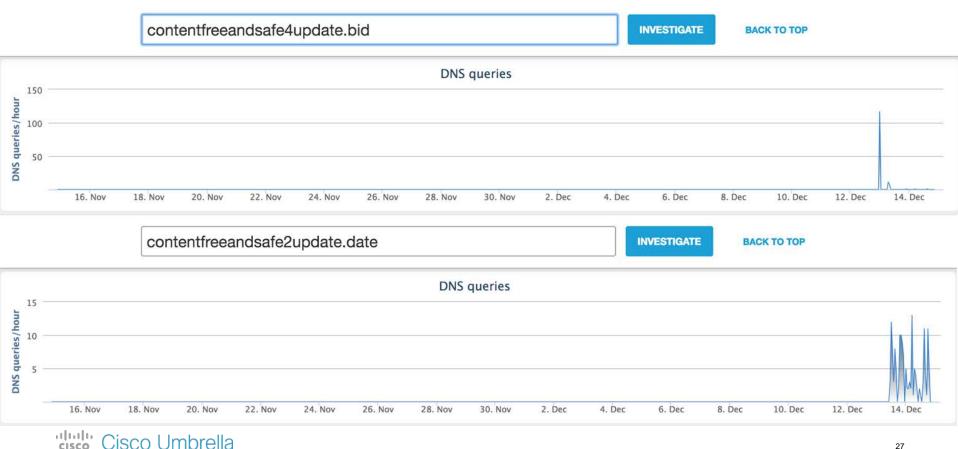




Consider the almighty RegeX

grep "*.fake.*"

Traffic Pattern of Fake Update Sites



Traffic Pattern of Fake Update Sites





For one word, many



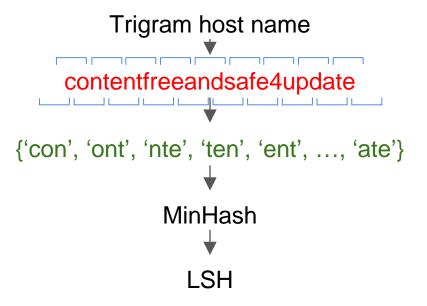
Shingling Fake Flash and Java Update

```
Trigram host name

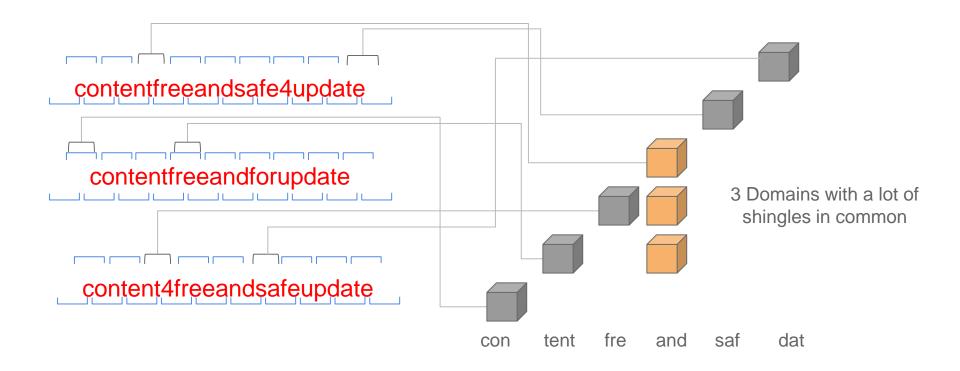
contentfreeandsafe4update

{'con', 'ont', 'nte', 'ten', 'ent', ..., 'ate'}
```

Shingling Fake Flash and Java Update



Locality Sensitive Hashing Fake Flash

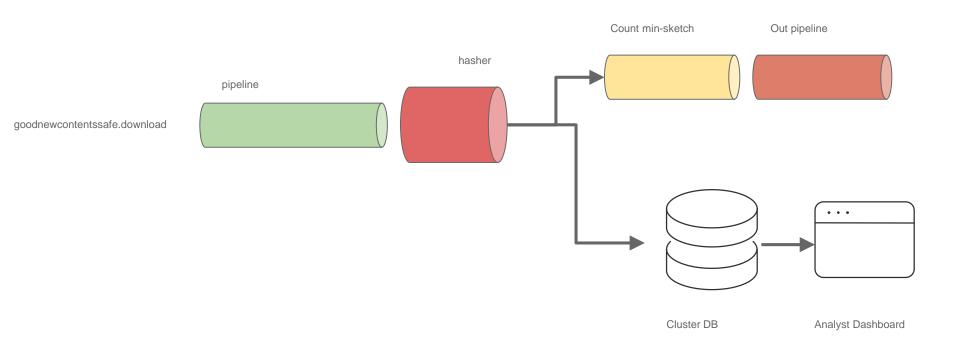




On to production



Clustering Pipeline Realtime/Batch





Payday



Fake Flash and Java Update Lexical Clustering

cluster 2: cluster 1: call-mlcrosoftnw-err81711102.win goodnewcontentssafe.download goodnewfreecontentsload.date call-mlcrosoftnw-err99817109.win call-mlcrosoftnw-err81711101.win goodnewfreecontentall.trade . . . cluster 3: cluster 4: artificialintelligencesweden.se mkto-sj220048.com artificialintelligencechip.com mkto-sj220146.com mkto-sj220162.com artificialintelligence.net.cm

. . .

We need help



Simple Flask App Dashboard



```
30
31
             for j, domain in enumerate(entry['domains']):
32
                 entry['domains'][j] = {'domain': domain, 'timestamp': entry['ti
34
             entry.pop('timestamps')
36
        for i, idx in enumerate(date_changes):
            n = date_changes[i+1] if i < len(date_changes) - 1 else None
38
             r[idx:n] = sorted(r[idx:n], key=lambda x: x['c_num'])
39
    @app.route("/clusters/attribution", methods=['POST'])
    def attribution():
         if not request.ison:
            return "Error!"
44
         resp = \{\}
45
         for cluster id in request.ison:
46
             attr = request.json[cluster_id]
             ret = add_attribution(cluster_id, attr)
48
             resp[cluster_id] = ret
49
50
            if ret == 'success' and BLOCKING:
                 domains = m.get_cluster_domains(cluster_id)['domains']
                 block_description = "Domain showed similarities to {0} malverti
                print "Blocking domains: {0}".format(", ".join(domains))
54
                block(domains, block description=block description)
55
56
         return jsonify(resp)
    @app.route("/clusters/attribution/<string:cluster_id>")
    def get_attribution(cluster_id):
         return jsonify(m.get attribution(cluster id))
61
    @app.route("/clusters/uncategorized")
    def get uncategorized():
         r = [entry for entry in m.get_uncategorized()]
65
66
        if not r or len(r) == 1:
67
            return jsonify(results=r)
```

Hosting space and top talkers



Where are these hosted? Any patterns?

Take 1 week's worth of detections and their hosting space; Jan 1-7

Some hosters are consistently abused

AS12876, FR
AS14618 Amazon AWS and more

Some IPs are actively hosting thousands of domains for more

Some hosters are highly infested with shady, toxic content; dedicated?
 AS202023, LLHOST, RO; phishing, tech support scams, fake updates, porn



Who is querying these domains?

Take 1 week's worth of detections; Jan 1-7 and user IPs

10 busiest hours

20000+ user IPs querying 2000+ malvertising domains

Some top talker clusters emerge

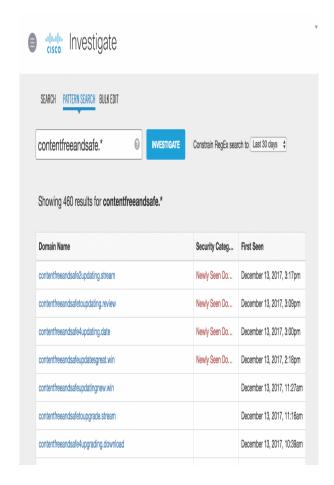
Security companies owned ranges querying hundreds of domains Some rogue networks querying hundreds of domains



Summary







grep ".foke.*"

Look for buret in traffic



hosting IPs

user IPs

Current and Future Work

NLP on misspellings and common typos

Models to categorize clusters

Identifying malicious file hosts using belief propagation



Thank you

Questions?

We are hiring

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