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U.S. DEPARTMENT OF
ENERGY

Detecting Credential Spear-phishing Attacks at LBNL

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#BroCon2017



U.S. DEPARTMENT OF
ENERGY



**UNIVERSITY OF
CALIFORNIA**



80 Years of World-Leading Team Science at Lawrence Berkeley National Laboratory

- **Managed and operated by UC for the U.S. Department of Energy**
- **>200 University of California faculty on staff at LBNL**
- **4200 Employees, ~\$820M/year Budget**
- **13 Nobel Prizes**
- **63 members of the National Academy of Sciences
(~3% of the Academy)**
- **18 members of the National Academy of Engineering,
2 of the Institute of Medicine**
- **Birthplace of Bro**



World-Class User Facilities Serving the Nation and the World



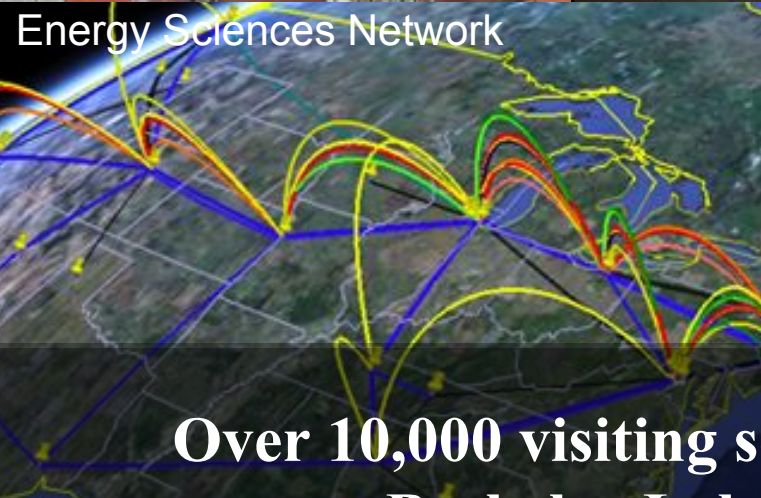
Advanced
Light
Source



Joint Genome Institute



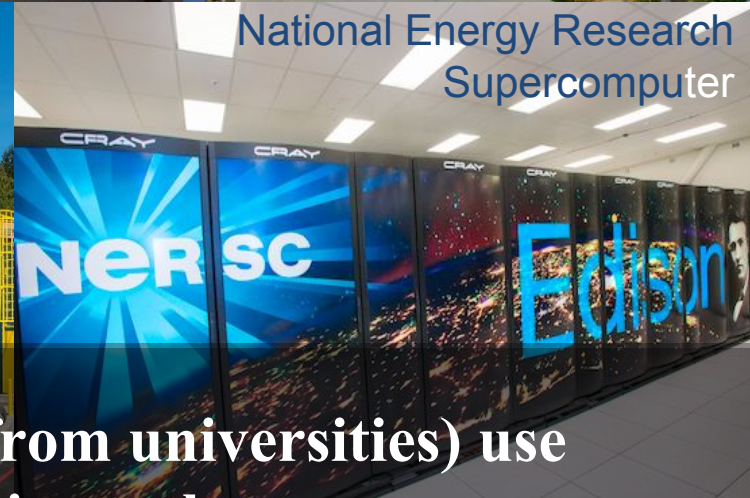
Molecular
Foundry



Energy Sciences Network



FLEXlab



National Energy Research
Supercomputer

**Over 10,000 visiting scientists (~2/3 from universities) use
Berkeley Lab research facilities each year**

Overview

- Current state of SMTP
- Gaining visibility into SMTP
- New scripts
 - alerts and False positives
- Realtime detector design for detecting credential stealing spearphish
 - Persistence and reputation databases
 - Scalability
- Implementation and deployment challenges
- Whats next

MailFlow

LBL Mailflow 2 (Ironport detail)

Derrick Johnson | December 2, 2015

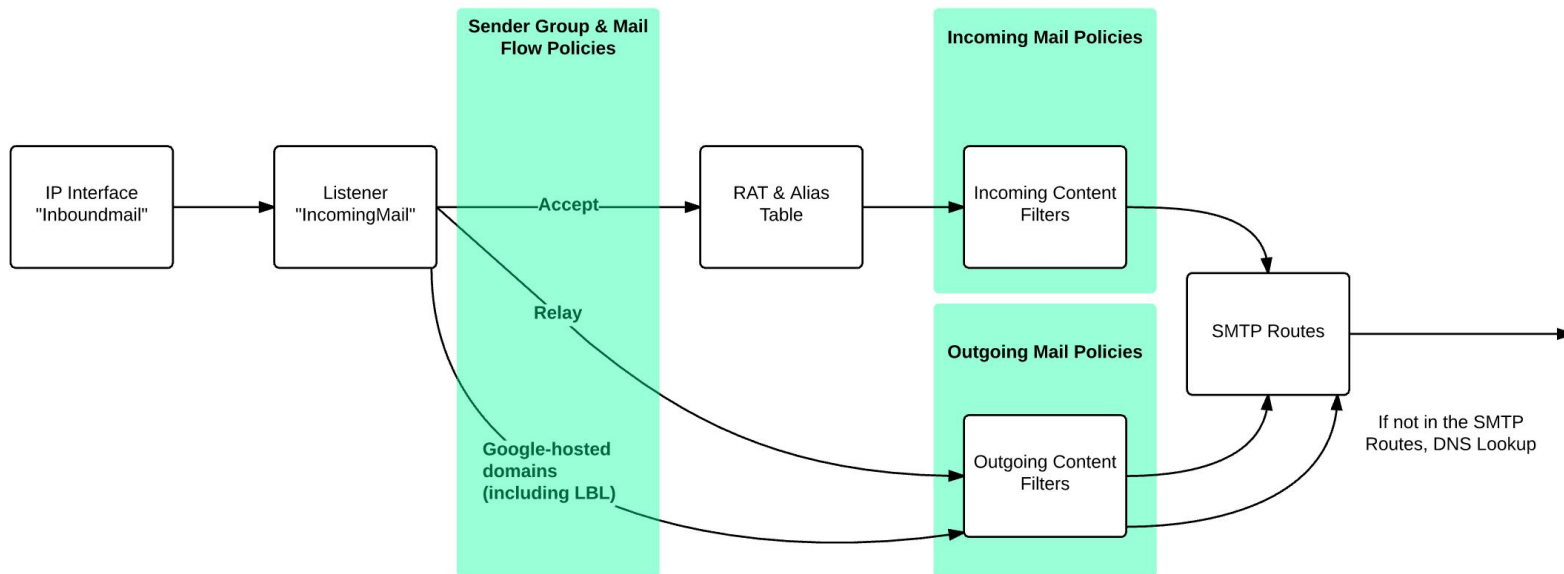


Image Credit: Derrick "The Great" Johnson

Yes, we do all conventional things

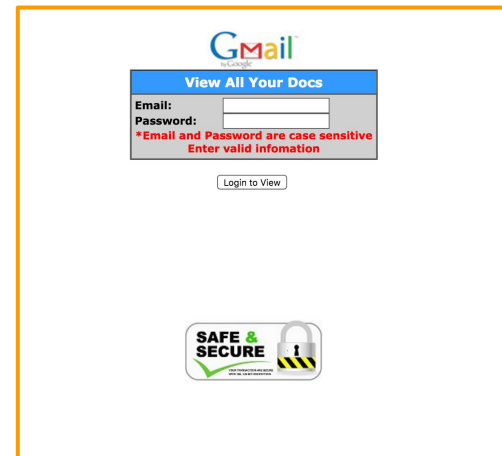
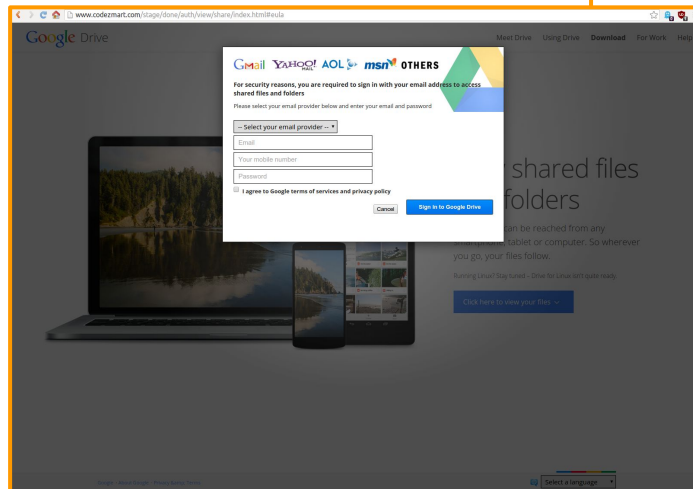
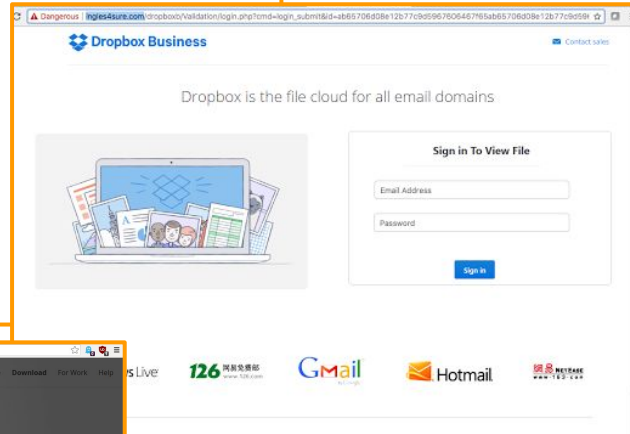
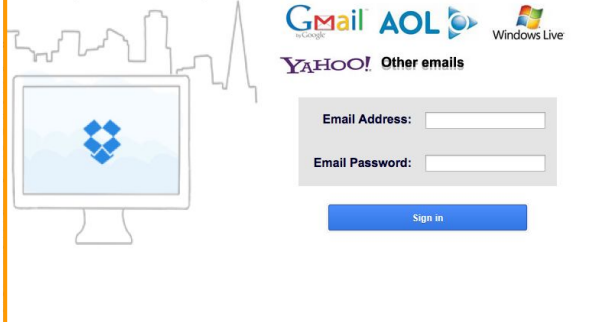
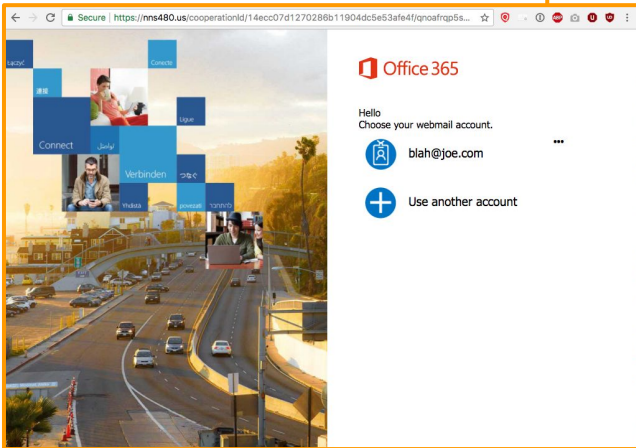
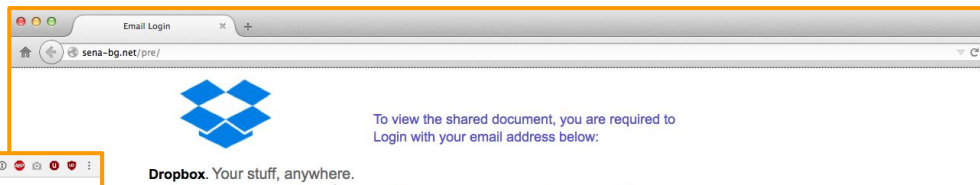
- Gmail
- Ironports
- Phishing specific security training
- Simulated Phishing Exercise
- RPZ
- Other Vendors*

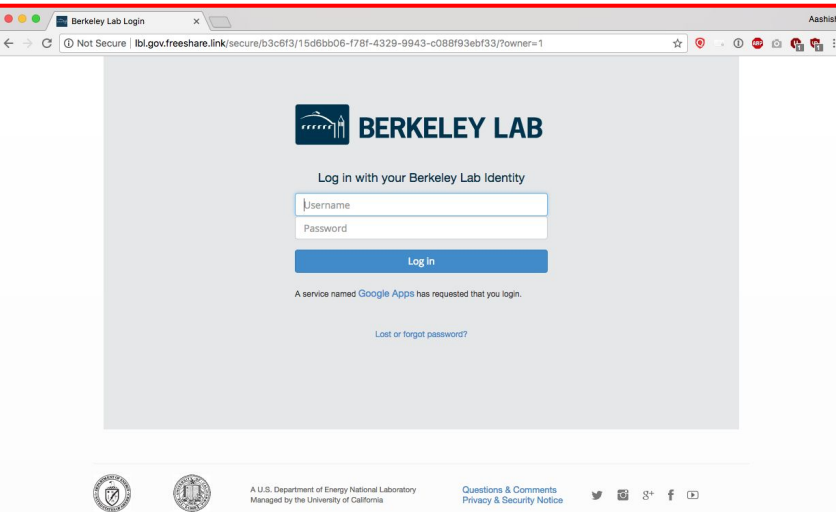
*We learnt that there is not a lot of work in URL analysis as opposed to heavy concentration on attachment analysis.


And yet phish makes it way in



Source: <https://gifrific.com/fish-jumps-out-of-water-and-hits-man/>







Hello,

The University is having a salary increment program again this year with an average of 2.5%.

The Human Resources department evaluated you for a raise on your next paycheck.

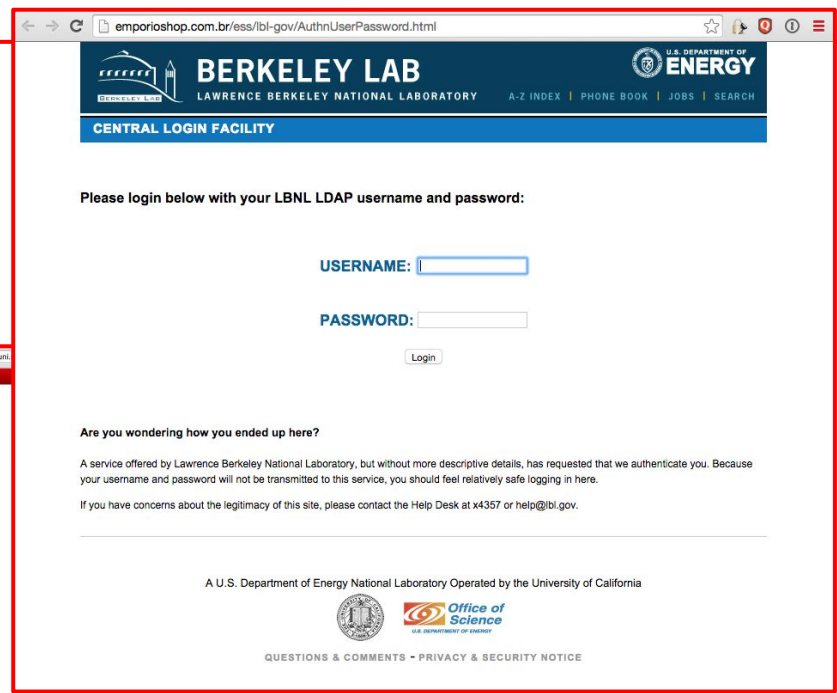
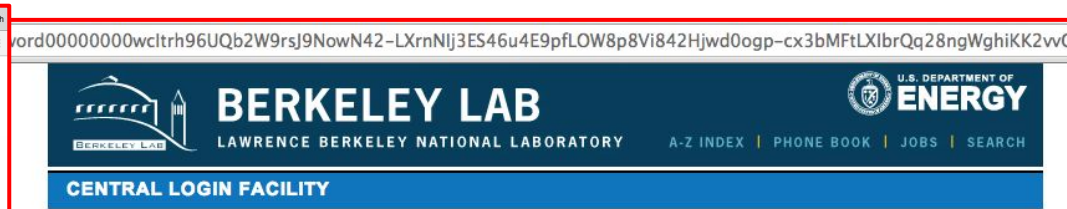
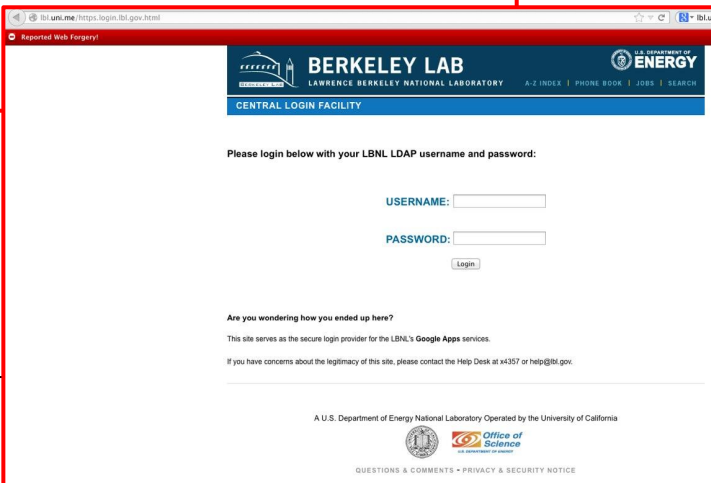
Click below to confirm and access your salary revision documents:

[Click Here](#) to access the documents

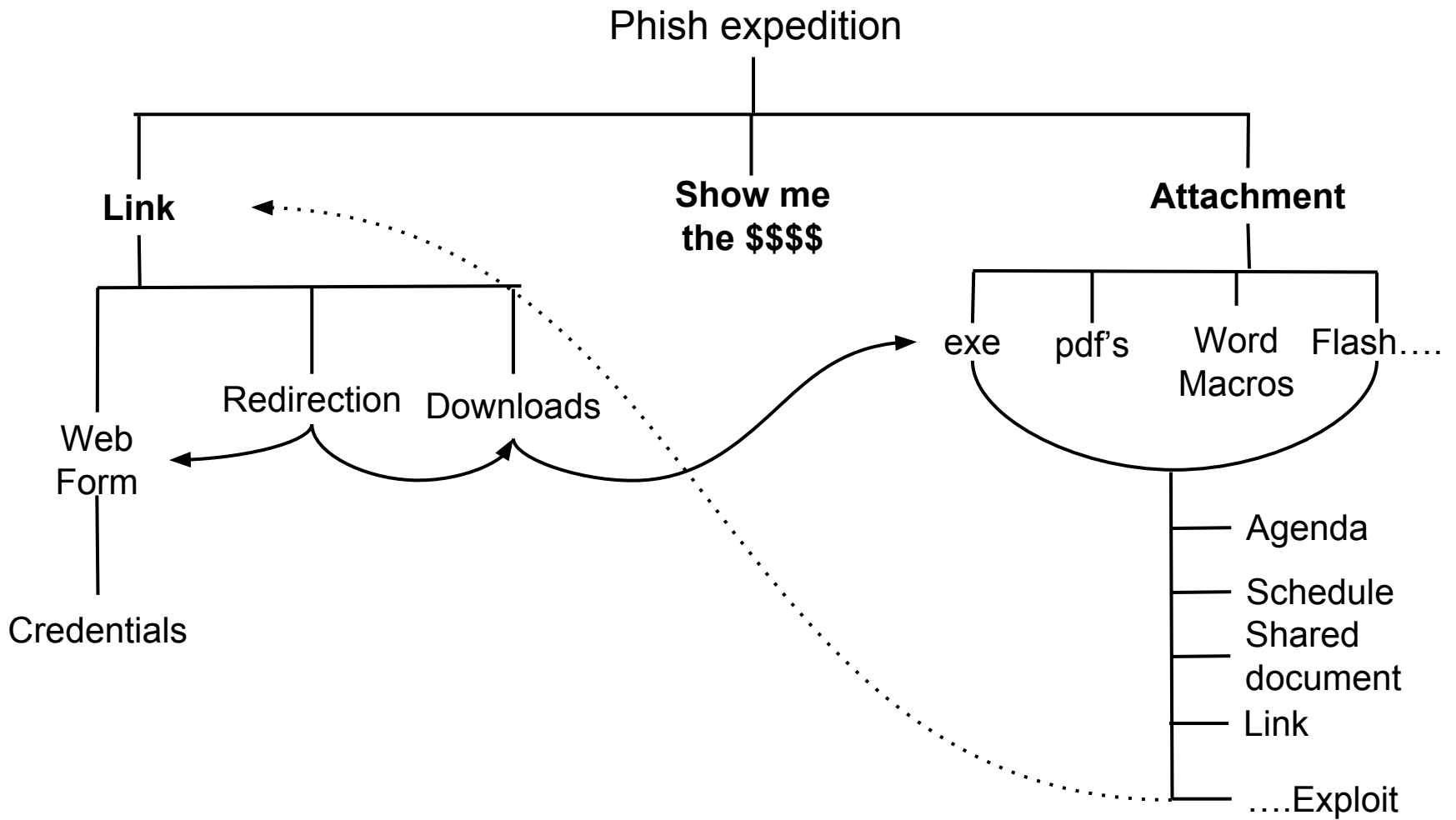
Sincerely,

Human Resources

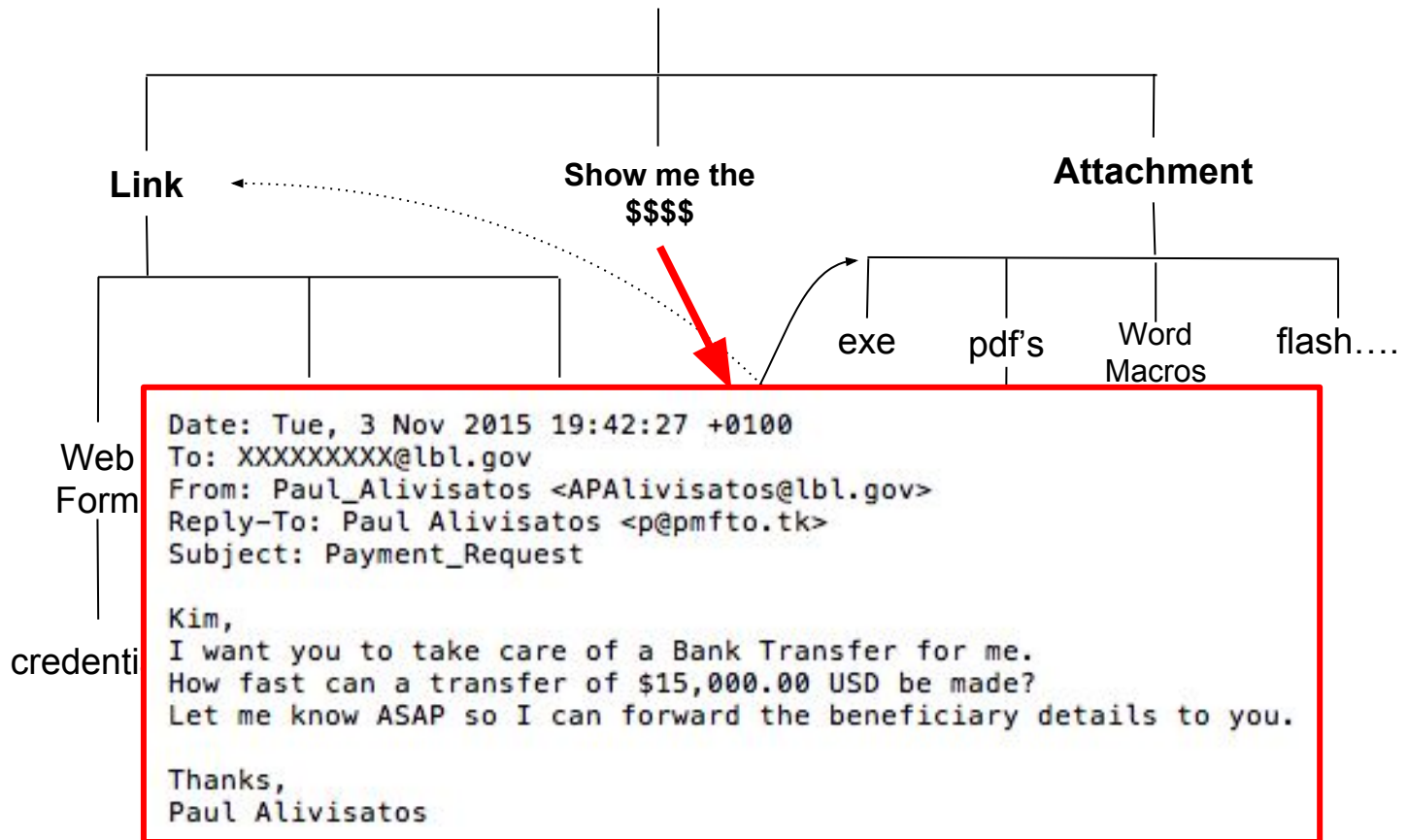
University of California, Berkeley



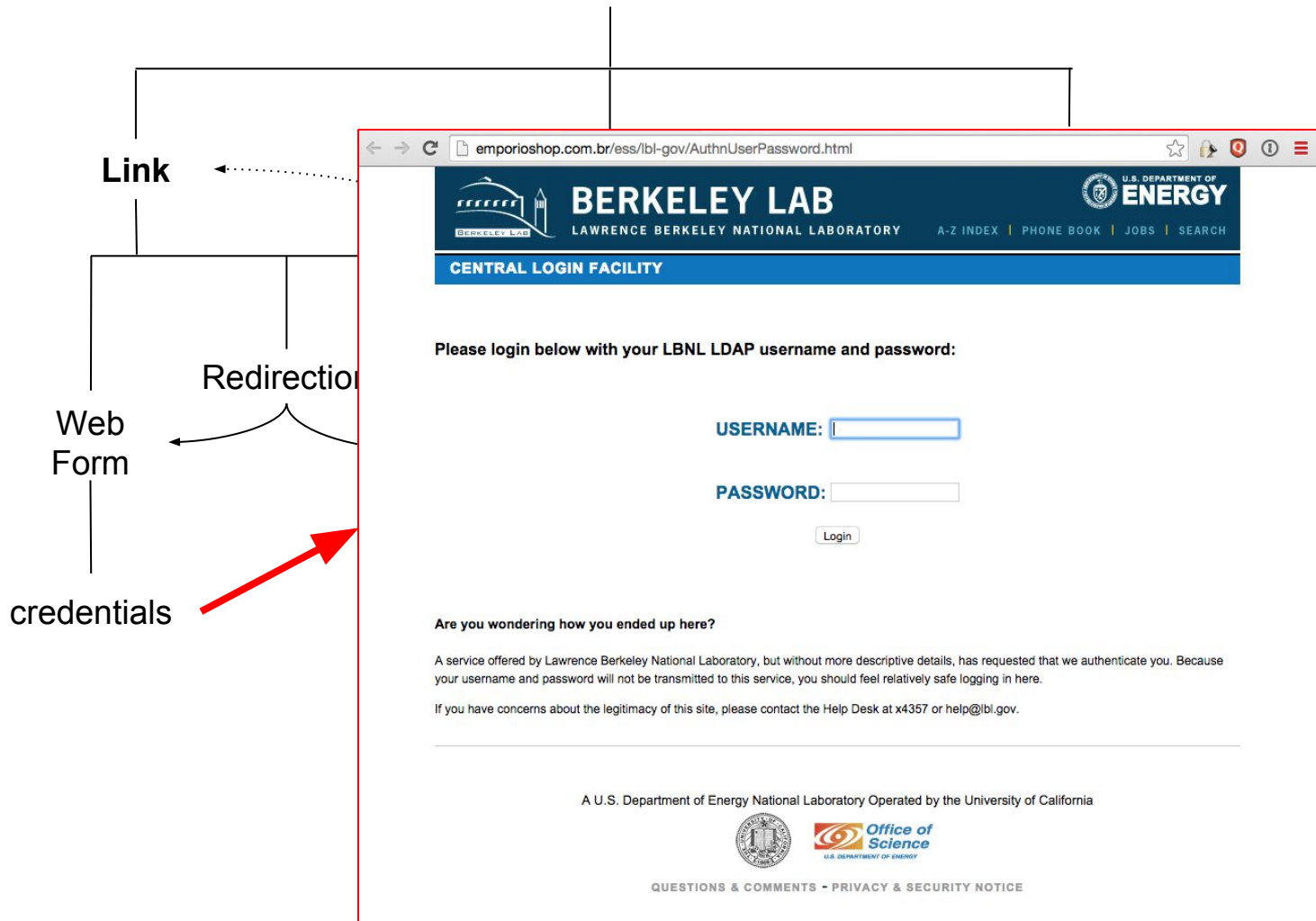
This work is a supplement to the existing technologies we've put in production



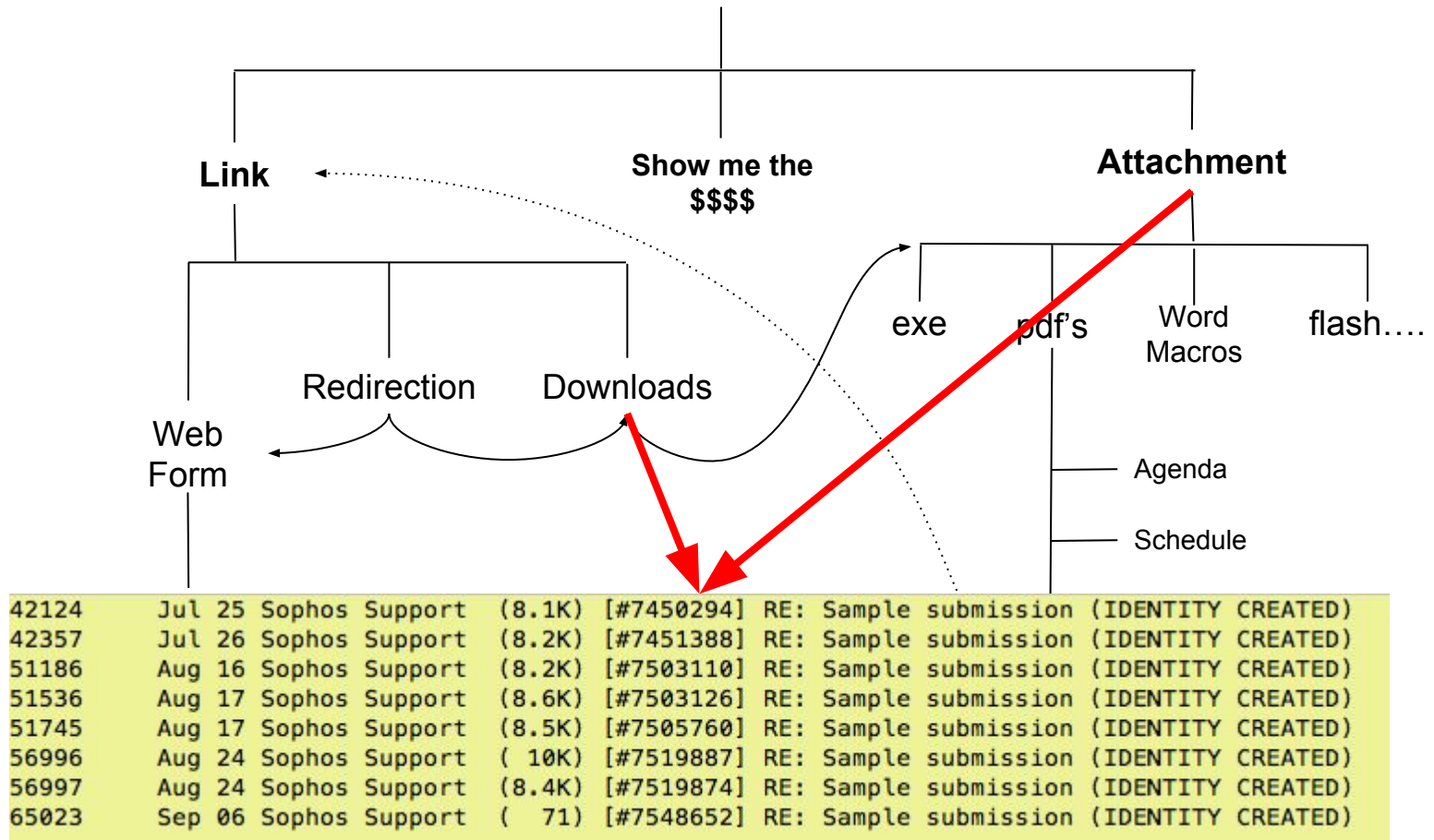
Phish: Exploit Payload



Phish: Exploit Payload



Phish: Exploit Payload



smtp.log | SMTP transactions

FIELD	TYPE	DESCRIPTION
ts	time	Timestamp when message was first seen
uid & id		Underlying connection info > See conn.log
trans_depth	count	Transaction depth if there are multiple msgs
helo	string	Contents of the HELO header
mailfrom	string	Contents of the MAIL FROM header
rcptto	set	Contents of the RCPT TO header
date	string	Contents of the DATE header
from	string	Contents of the FROM header
to	set	Contents of the TO header
cc	set	Contents of the CC header
reply_to	string	Contents of the ReplyTo header
msg_id	string	Contents of the MsgID header
in_reply_to	string	Contents of the In-Reply-To header
subject	string	Contents of the Subject header
x_originating_ip	addr	Contents of the X-Originating-IP header
first_received	string	Contents of the first Received header
second_received	string	Contents of the second Received header
last_reply	string	Last server to client message
path	vector	Message transmission path, from headers
user_agent	string	Value of the client User-Agent header
tls	bool	Indicates the connection switched to TLS
fuids	vector	File unique IDs seen attached to message
is_webmail ¹	bool	If the message was sent via webmail

¹If policy/protocols/smtp/software.bro is loaded

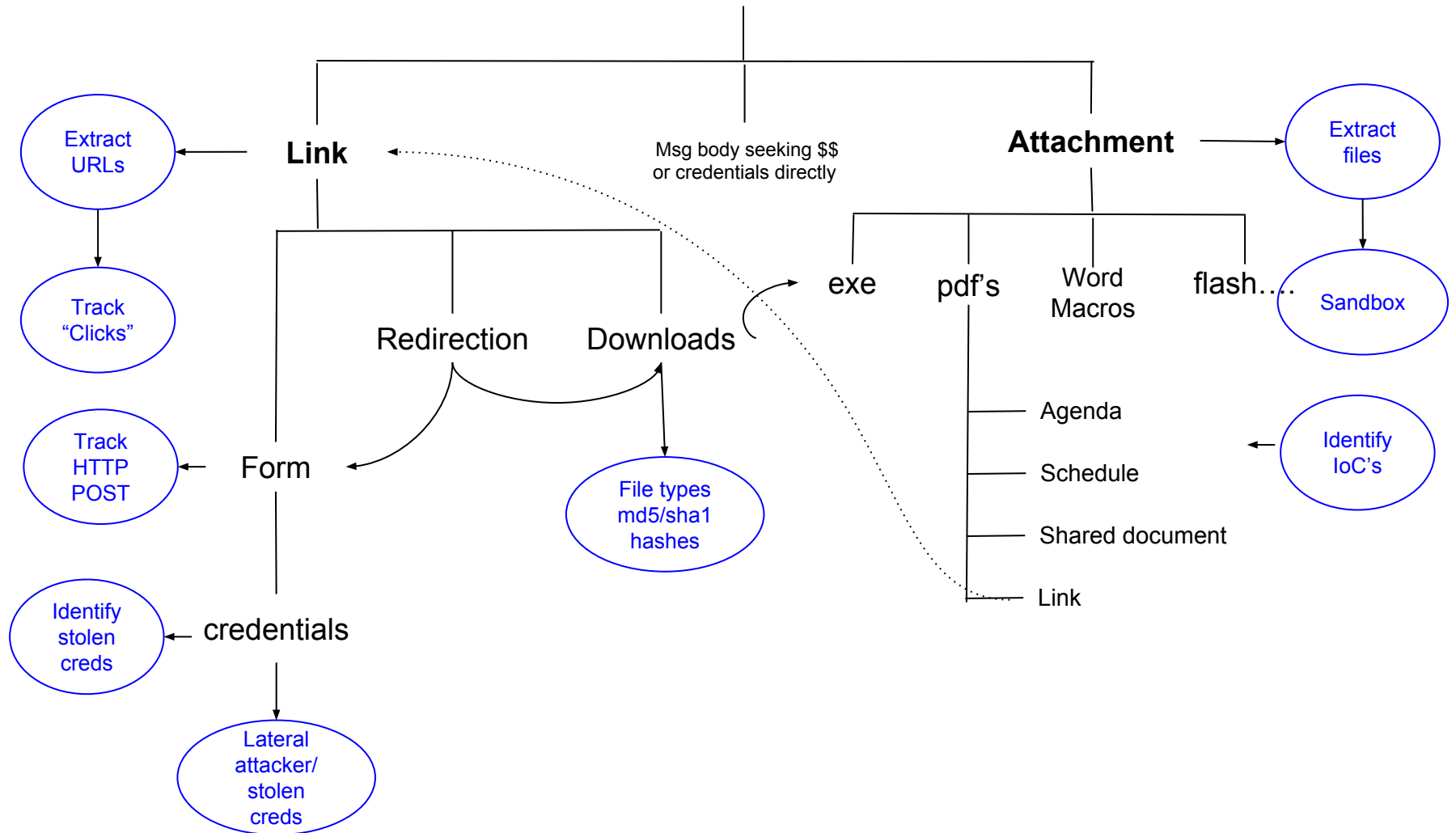
But data from this SMTP::Info record isn't sufficient anymore

We need more visibility than just timestamp, sender, recipients, subject, dates, path, reply, originating_ip, user_agent etc etc

We need more visibility into SMTP

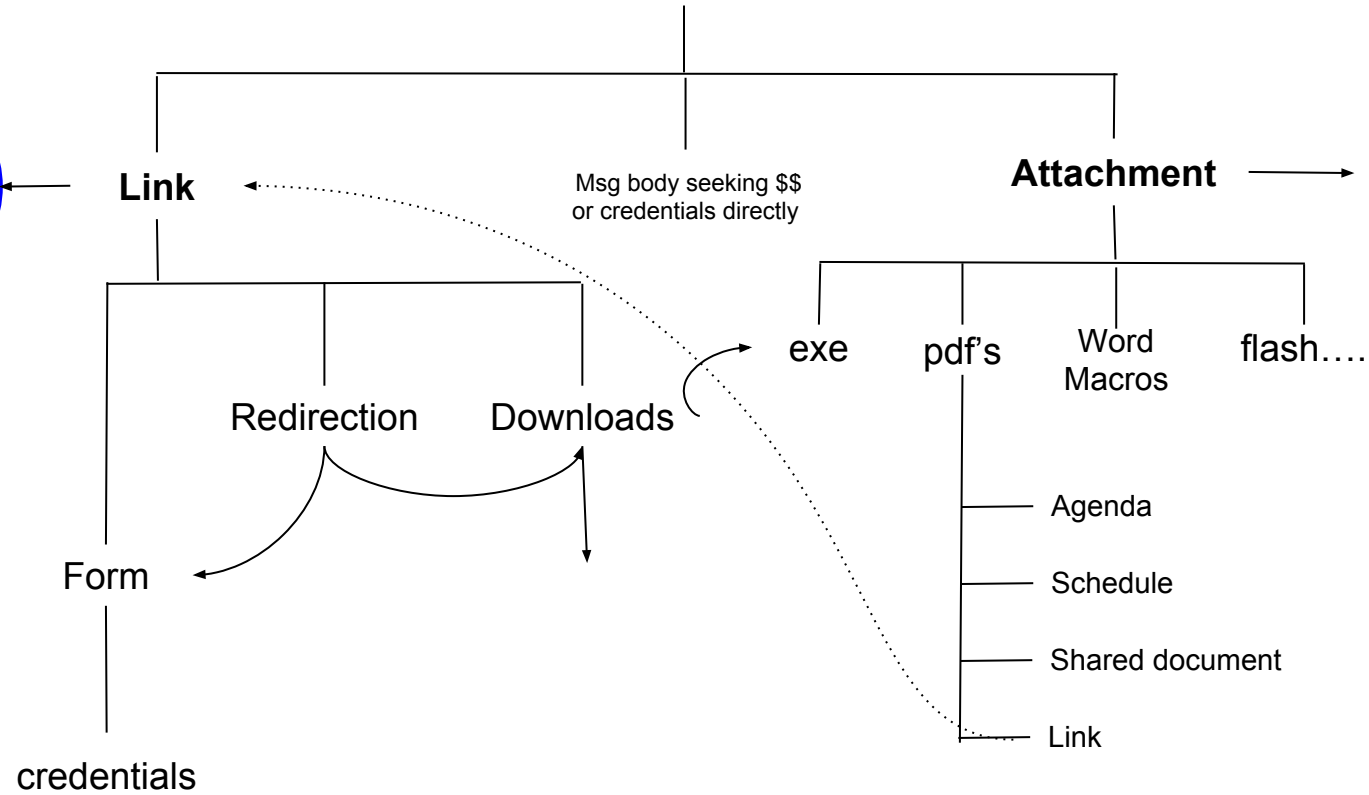
- New log which gives us all the URLs seen in email
- New ability to track
 - which URLs get clicked on
 - signature match on URLs
 - generate alerts based our knowledge from past
- New Alerts to identify if a clicked URL transmitted a
 - File (exe, rar etc)
 - Credentials

PHISH



PHISH

Extract
URLs




What does it take to Extract URLs

```
event mime_all_data(c: connection, length: count, data: string)
  &priority=-5
{
  if (! c?$smtp)
    return ;

  local urls = find_all_urls(data) ;

  for (link in urls)
  {
    local url = split_string(link,/ /)[0];
    url = gsub(url,/\\]$|\\)$/, "");
    event Phish::process_smtp_urls(c, url);
  }
}
```

```
event Phish::process_smtp_urls(c: connection, url: string)
{
    log_smtp_urls(c, url);
}
```




```
function log_smtp_urls(c:connection, url:string)
{
    local info: Info;

    info$ts = c$smtp$ts;
    info$uid = c$smtp$uid ;
    info$id = c$id ;
    info$url = url;
    info$host = extract_host(url) ;

    Log::write(Phish::Links_LOG, info);
}
```



New Log: smtpurl_links.log

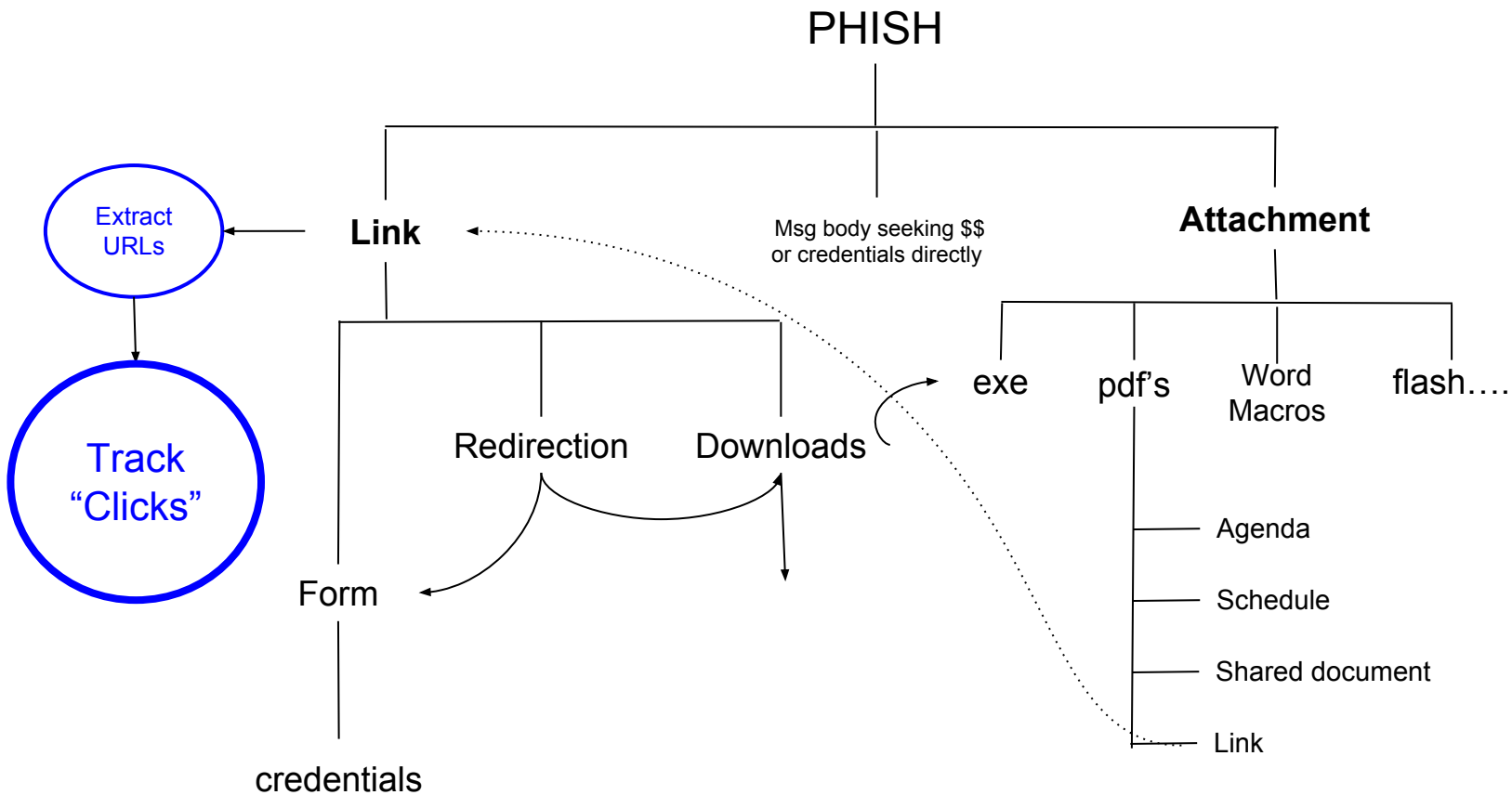
#fields	ts	uid	id.orig_h	id.orig_p	id.resp_h	id.resp_p	host	url
#types	time	string	addr	port	string	string		
Aug 31	12:02:57	CD59BMs7lSW09XL5e		119.76.101.162	52594	128.3.30.30	25	bayimpex.be http://bayimpex.be/dropbox.html
Aug 31	12:02:59	CFxh8P37ZmEowXWjt4		113.160.129.28	29056	128.3.30.30	25	aegelle.com http://aegelle.com/dropbox.html
Aug 31	12:03:08	CJReqg2Cgof2XUlnm7		109.98.108.83	49885	128.3.30.30	25	eifel-netz.de http://eifel-netz.de/dropbox.html
Aug 31	12:03:08	CCqP6GmCx1DaC0FoI		180.148.210.162	5957	128.3.30.30	25	busad.com http://busad.com/dropbox.html
Aug 31	12:03:16	CyRHVE3L86qGKXaqZg		187.126.98.37	52553	128.3.30.30	25	fachwerkhaus.ws http://fachwerkhaus.ws/dropbox.html
Aug 31	12:03:33	C6lnBp4j70g016HwD5		122.166.114.144	63353	128.3.30.30	25	avtokhim.ru http://avtokhim.ru/dropbox.html
Aug 31	12:03:42	CLUmwX4AEmoqzzdhcd		187.37.84.194	62255	128.3.30.30	25	potamitis.gr http://potamitis.gr/dropbox.html
Aug 31	12:03:43	CyVZGk20eciHWuVgAk		113.167.126.130	58407	128.3.30.30	25	busad.com http://busad.com/dropbox.html
Aug 31	12:04:12	CsDFfI2vNOXwzISJU2		182.187.89.116	5685	128.3.30.30	25	avtokhim.ru http://avtokhim.ru/dropbox.html
Aug 31	12:04:15	Cef4Wp3dJcyvvhmfB		150.107.8.186	35495	128.3.30.30	25	albion-cx22.co.uk http://albion-cx22.co.uk/dropbox.html
Aug 31	12:04:30	CSY2S13EFmSvGcTJAa		178.149.36.9	54414	128.3.30.30	25	patrickreeves.com http://patrickreeves.com/dropbox.html
Aug 31	12:05:15	CT7T5eDKEzQUKDsmd		138.204.89.129	57988	128.3.30.30	25	melting-potes.com http://melting-potes.com/dropbox.html
Aug 31	12:05:22	CD09uih7h60LoN6y1		5.152.239.178	51524	128.3.30.30	25	tasgetiren.com http://tasgetiren.com/dropbox.html
Aug 31	12:05:31	CdL7ZY9pww7Gs3p24		190.97.254.210	63941	128.3.30.30	25	conlin-boats.com http://conlin-boats.com/dropbox.html

URL Extraction Internals

- Fairly simple to extract URLs from msg body
- Occasional parsing issues
- Correct Regex for URL to be extracted is the only tricky part here

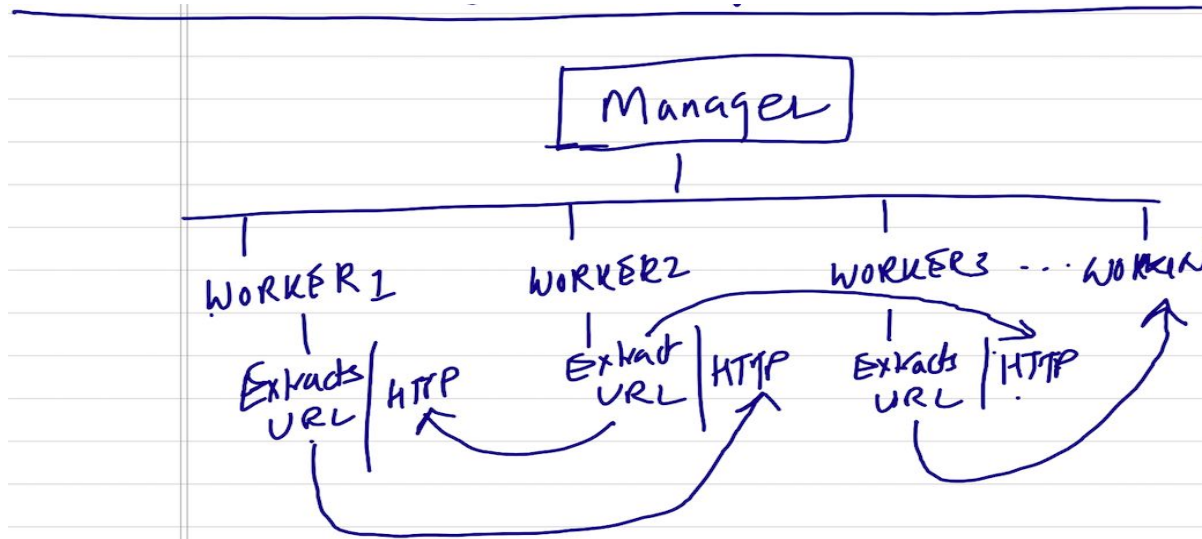
```
const url_regex = /^https?:\/\/([a-z0-9A-Z]+(:[a-zA-Z0-9]+)?@)?[-a-z0-9A-Z-](\.[a-z0-9A-Z-])*((:[0-9]+)?)(\[a-zA-Z0-9;:\/\.\_\+\%~?&@=#\(\)\]*)?/
```

- Bro takes care of logging etc
- Logging framework makes cluster/standalone transparent



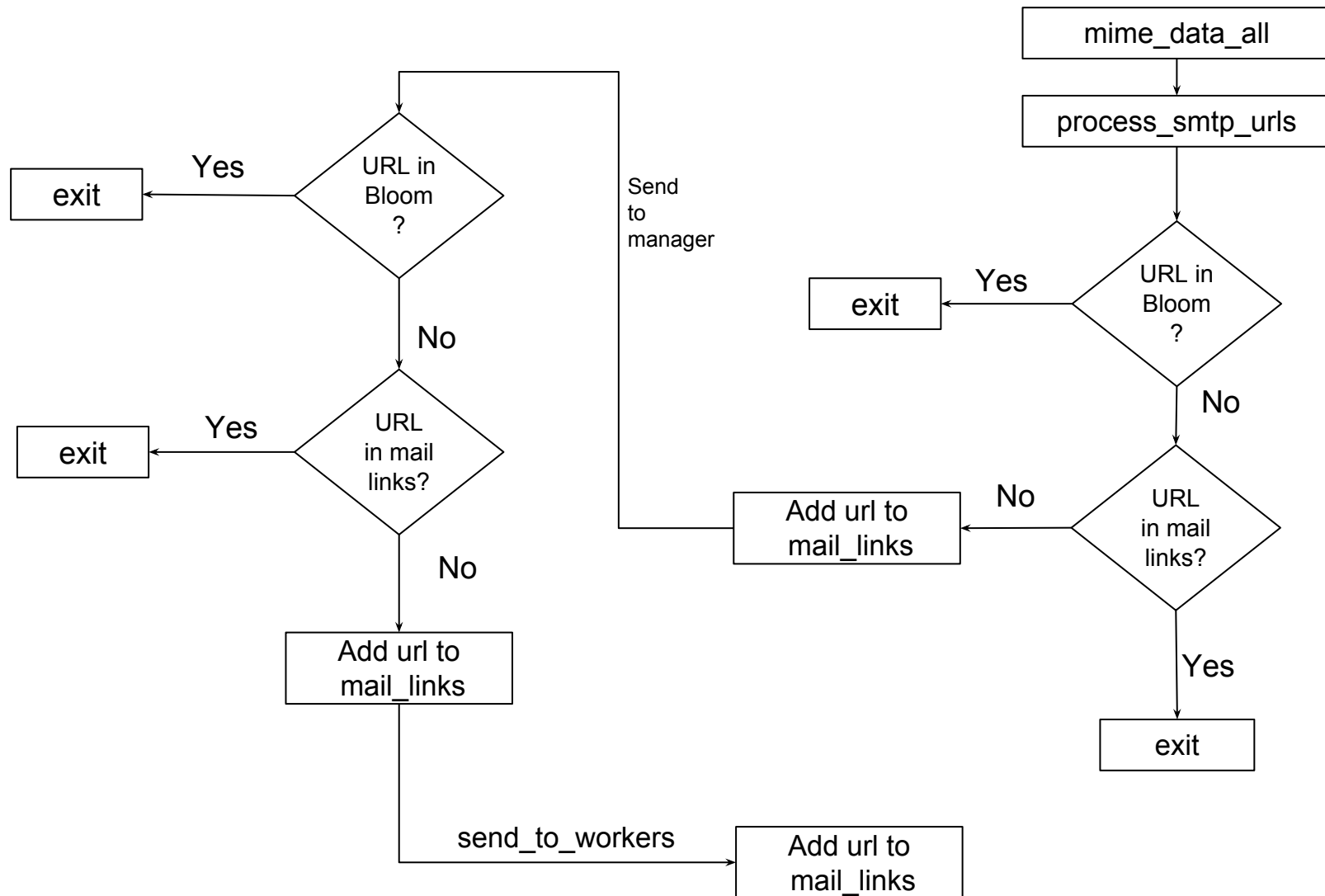
Since we've got SMTP URL's logged won't it be nice to know which ones got clicked-on ? and by who ?

Problem in tracking URLs: Clusterization



- Worker-X processes a SMTP session and extracts a URL
- Worker-Y processes the HTTP GET request for that specific URL
- In short: on a cluster it is mostly unpredictable which worker will process what traffic
- So to track **every** click for **every** extracted URL we need to have
 - All Extracted URLs go to all workers, **or**
 - All HTTP traffic go to all workers, **or**
 - URLs and HTTP traffic go to Manager, **or**
 - Imagine a nice data node which see's all logs

High Level architecture of distribution of URLs in a Cluster



New log: smtp_clicked_urls.log

Connection Record

1481062180.295358 C3W4S51MSDKicZfirj 128.3.x.y
39017 107.21.6.90 80 lbl.gov.invoicenotices.com

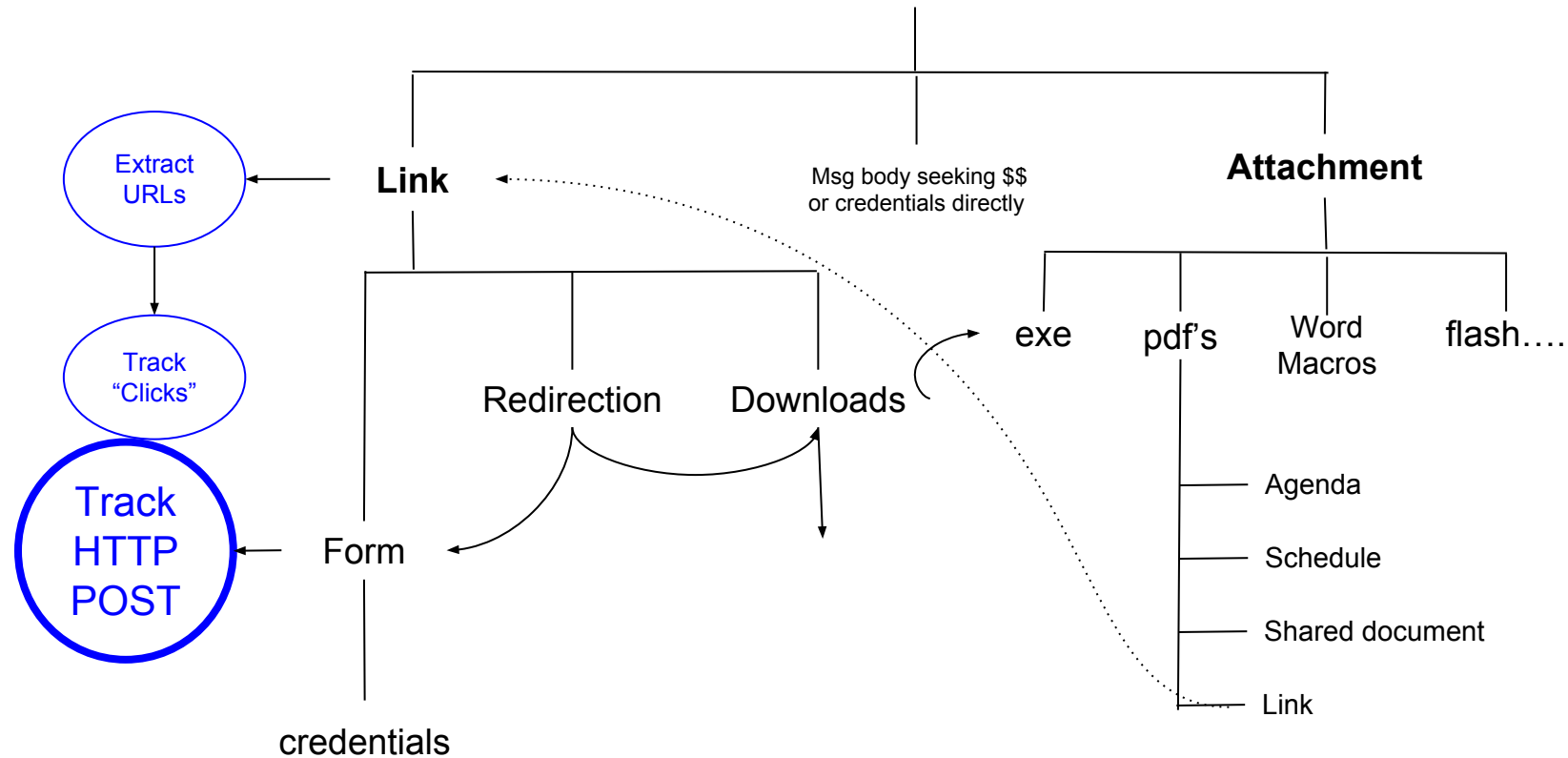
http://lbl.gov.invoicenotices.com/0cb548/?login_id=c25acd74-aed4-43f3-89a5-563a03a0d9cc

URL

1481050626.364467 CgP4Rc3LGXkLOhkjWc Frank Zuidema
<fzuidema@lbl.gov> XXXXX@lbl.gov Document review -
Invitation to edit (empty)

First email in which
this URL was seen

PHISH



- Identify passwords transmitted in HTTP POSTs
- Identify FileDownload
- Alert on "SensitiveURLs"
 - Simply signature matching parts of URL string

Tracking HTTP Posts

- Since we can track link clicks, we can identify if any passwords are transmitted over HTTP:

```
1467998894.642754  CiGsf4XOymomXJTH8  128.3.X.Y  64310  104.16.58.61  80  -  -  -  tcp
HTTP::HTTPSensitivePOST Request: /electacta/login_action.asp - Data:
username=XXXXXXX@lbl.gov&password=Lopezcz$19&rememberMe=on&role=editor&bypass=&rememberUser=1&ignoreWarnin
g=0  -  128.3.X.Y  104.16.58.61  80  -  bro  Notice::ACTION_LOG  3600.000000  F  -  -  -  -  -
```

If password matches certain
complexity Criteria

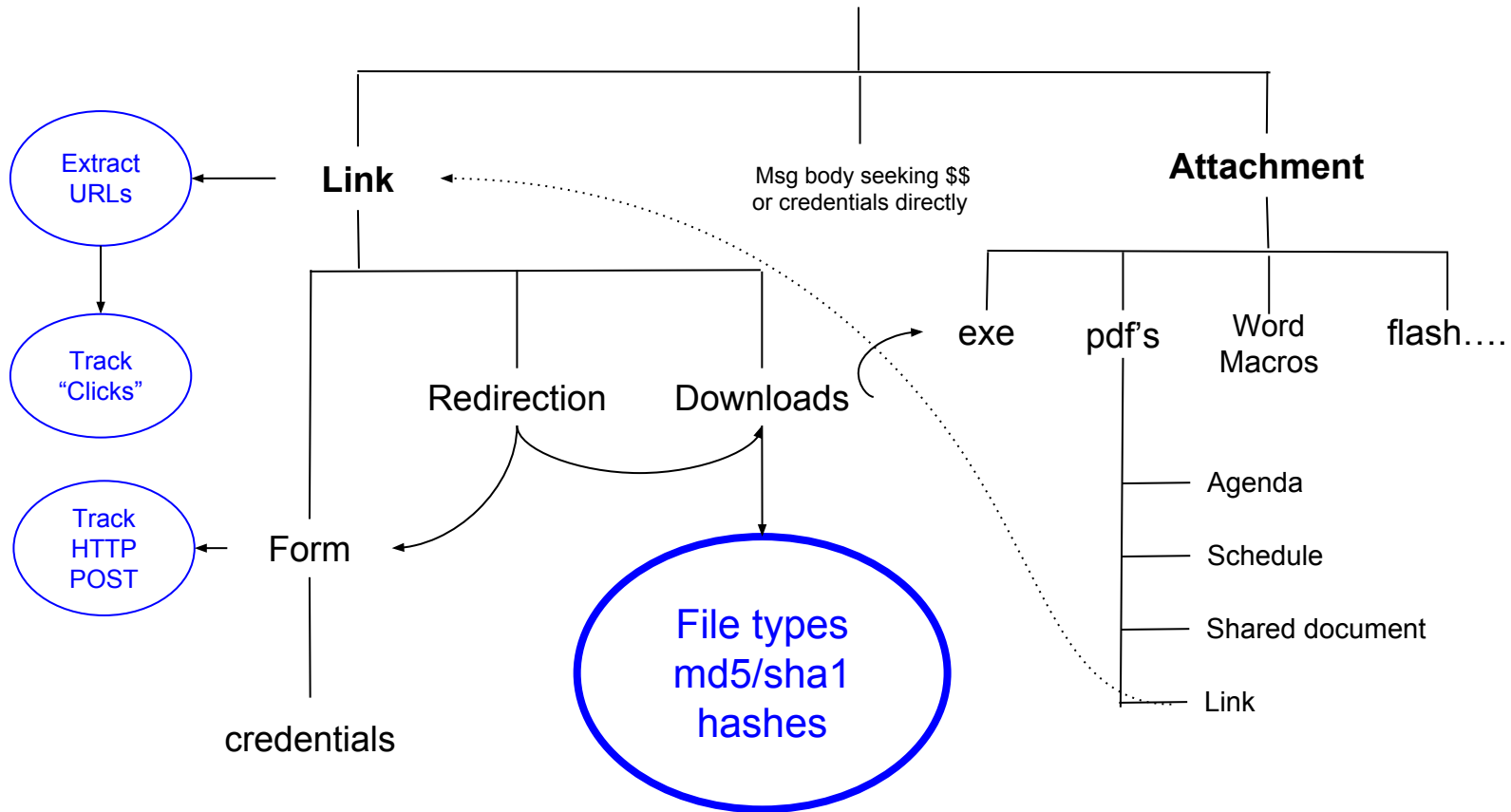
```
1467998894.642754  CiGsf4XOymomXJTH8  128.3.X.Y  64310  104.16.58.61  80  -  -  -  tcp
HTTP::HTTP_Sensitive_Passwd Request: /electacta/login_action.asp - Data:
username=XXXXXXX@lbl.gov&password=Lopezcz$19&rememberMe=on&role=editor&bypass=&rememberUser=1&ignoreWarni
ng=0  -  128.3.X.Y  104.16.58.61  80  -  bro  Notice::ACTION_LOG  3600.000000  F
```


New Alert: SensitiveURI

```
1351714828.429308   Cu8Nlk1PAJLiEM4Kd9   128.3.41.133   1277   209.139.197.113 25   -   -  
-   tcp   Phish::SensitiveURI   Suspicious text embedded in URL  
http://avtokhim.ru/dropbox.html from Cu8Nlk1PAJLiEM4Kd9   -  
128.3.41.133209.139.197.113 25   -   bro   Notice::ACTION_LOG   3600.000000   F
```

- Signature Match on specific strings within the URLs.
- Mostly useful to flag phishing campaigns built with phishing toolkit
 - /dropbox/dropbox.html

PHISH

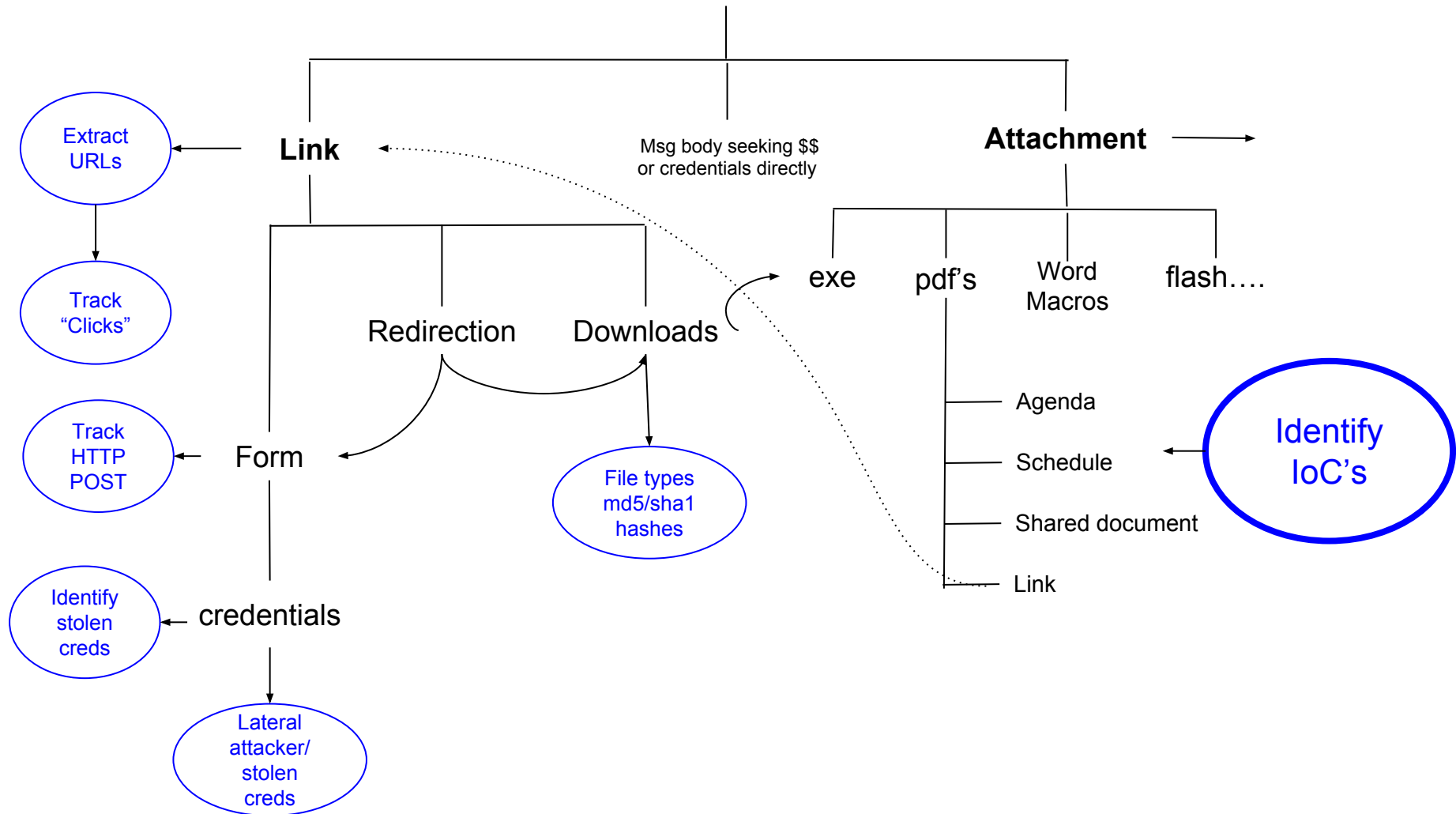


New Alert: FileDownload

```
1481499234.568566    C59XU64EvEHN5fr1Th    128.3.x.y    49067    46.43.34.31    80
FxrREO3dgc nSIAQZO8    application/x-dosexec
http://the.earth.li/~sgtatham/putty/0.67/x86/putty.exe tcp    Phish::FileDownload
[ts=1481431889.562629, uid=CCCqPL3ZaXmxqdMFJ1, from=cmdline <cmdline@gmail.com>,
to=GUI <gui_person@lbl.gov> , subject=putty.exe, referrer=[] ]
http://the.earth.li/~sgtatham/putty/0.67/x86/putty.exe 128.3.x.y    46.43.34.31    80    -    bro
Notice::ACTION_LOG    3600.000000    F
```

We can further Notice on “**Phish::WatchedFileType**”,
ex: URLs containing .pdf or .rar or .tar.gz or ...

PHISH



Identifying Known Known's: Intel feeds

- Malicious Sender
- Malicious Subject
- Malicious Attachment
 - MD5/SHA1
 - Name
 - Mime-type
- Targeted Recipient (ex. Honeypot addresses)
- Malicious reply_to, rcptto,
- Malicious IP origin or in path

New Policy: smtp-malicious-indicators.bro

- Periodic cron to dump all smtp indicators into one flat file
- Bro reads these smtp indicators using input-framework
- Matches against various event attributes
- Generate a notice or an alert

New Alert: Known Malicious Actors

```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_Mailfrom [indicator=german.mendoza@gpm.com.ve, description=bad-sender],
german.mendoza@gpm.com.ve      german.mendoza@gpm.com.ve      Notice::ACTION_EMAIL,Notice::ACTION_LOG 60.000000      F
```

```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_from      Malicious Sender :: [indicator="Mr. Seigfrid Hernandez"
<german.mendoza@gpm.com.ve>, description=full-bad-sender], "Mr. Seigfrid Hernandez" <german.mendoza@gpm.com.ve>
"Mr. Seigfrid Hernandez" <german.mendoza@gpm.com.ve>      Notice::ACTION_EMAIL,Notice::ACTION_LOG 60.000000      F
```

```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_reply_to      Malicious reply_to:: [indicator=german.mendoza@gpm.com.ve,
description=bad-sender], german.mendoza@gpm.com.ve      german.mendoza@gpm.com.ve
Notice::ACTION_EMAIL,Notice::ACTION_LOG 60.000000      F
```

```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_subject      Malicious Subject:: [indicator=RFQ # 170227 - Atlas Copco Spare Parts -
Jerwia, description=bad-subject], Notice::ACTION_EMAIL,Notice::ACTION_LOG 60.000000      F
```

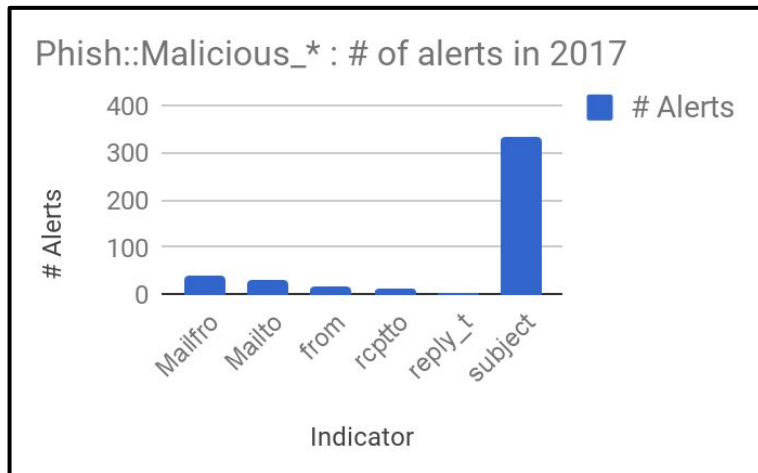
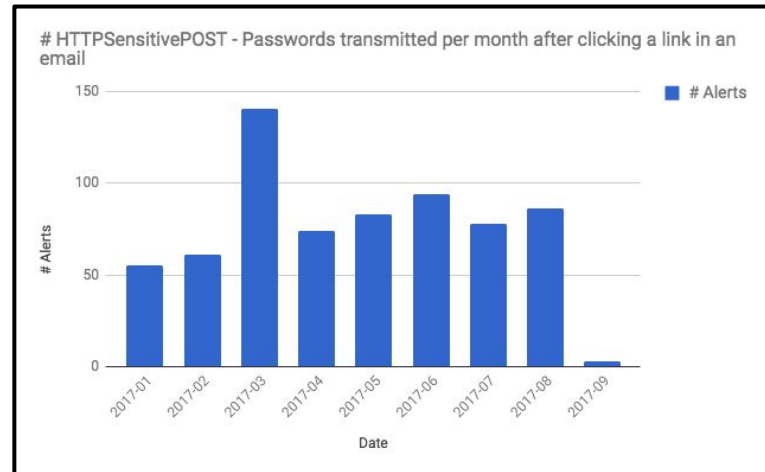
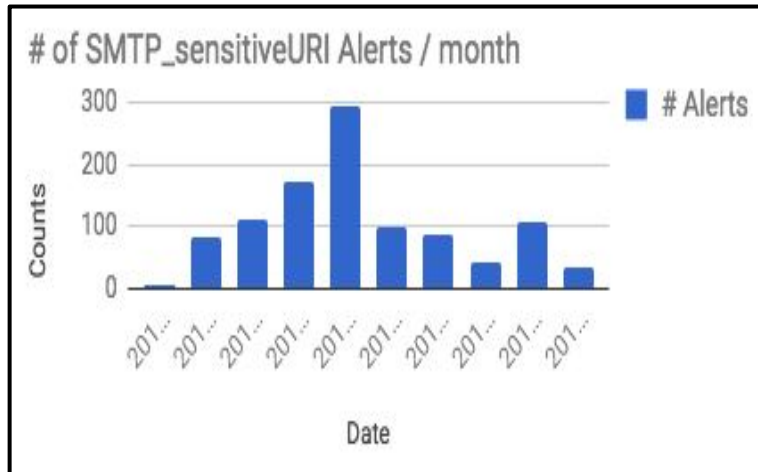
```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_Path      Blacklisted IP in smtp relay Path: [indicator=185.29.10.121, description=bad-ip ]
185.29.10.121 185.29.10.121      107.161.187.234 128.3.41.120 25      bro      Notice::ACTION_LOG      60.000000      F
```

```
1504682044.991930      C4nWFy2vtwAcv0Qt8l      107.161.187.234 45086      128.3.41.120      25      tcp
Phish::Malicious_rcptto :: [indicator=XXXXXXX@lbl.gov, description=recipient], bro
Notice::ACTION_EMAIL,Notice::ACTION_LOG 60.000000      F
```

Gaining Visibility: Summary

- We've got capability of
 - Identifying URLs from email
 - Signature matching on those URLs
 - Signature matching on smtp record based on intel-feeds
 - Identifying actions as consequence of the URL giving us a solid forensic trail
 - Clicks
 - HTTP POSTS
 - Downloads
 - Estimate on the file types pointed to by URL
- Now let's look at the performance

Performance: Number of Alerts Generated



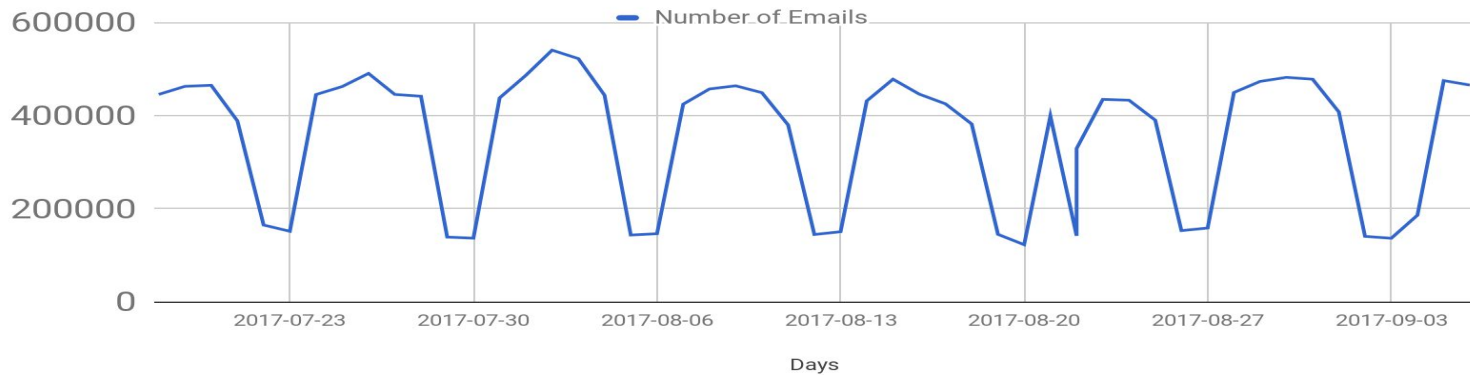
Yet, these are not enough...

Alerts just too damn high
(272 on a random day)

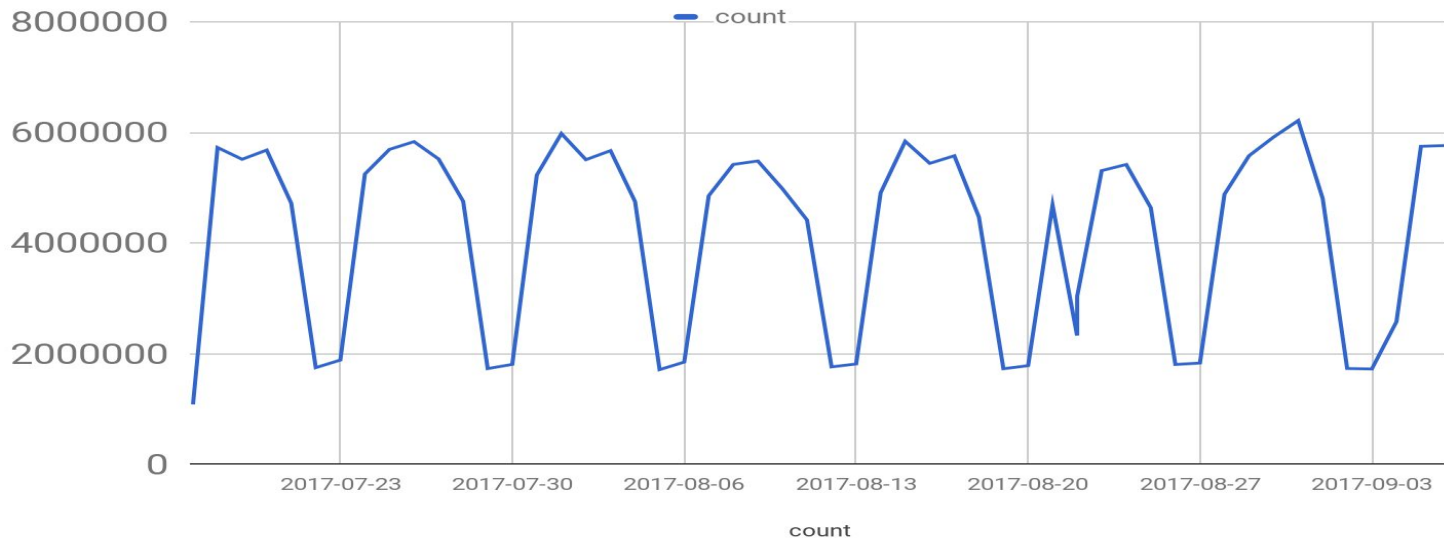
And We still need to catch the phish we gotta catch

Observation: #URLs in Email = 10 x # Emails

Number of Emails per Day (2017-07-18 to 2017-09-03)

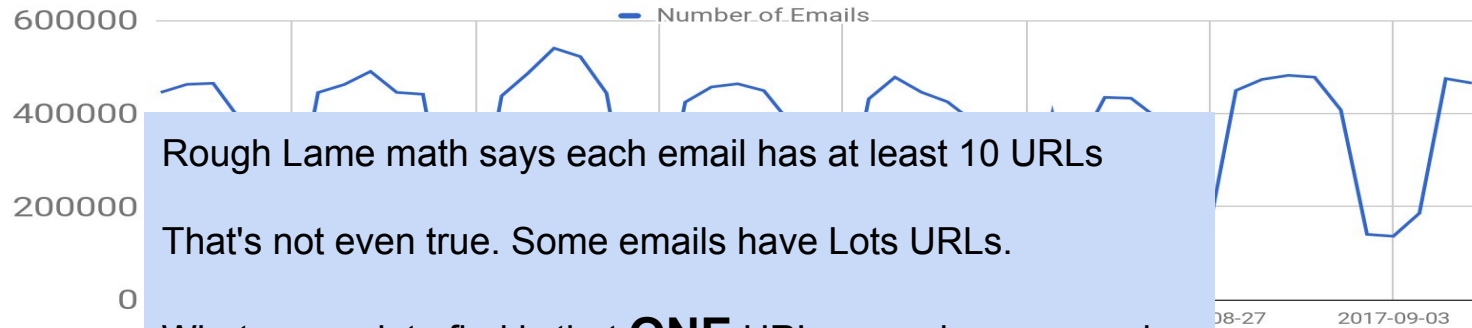


Number of URLs in Emails Per Day



Observation: # URLs in Email = 10x # Emails

Number of Emails per Day (2017-07-18 to 2017-09-03)

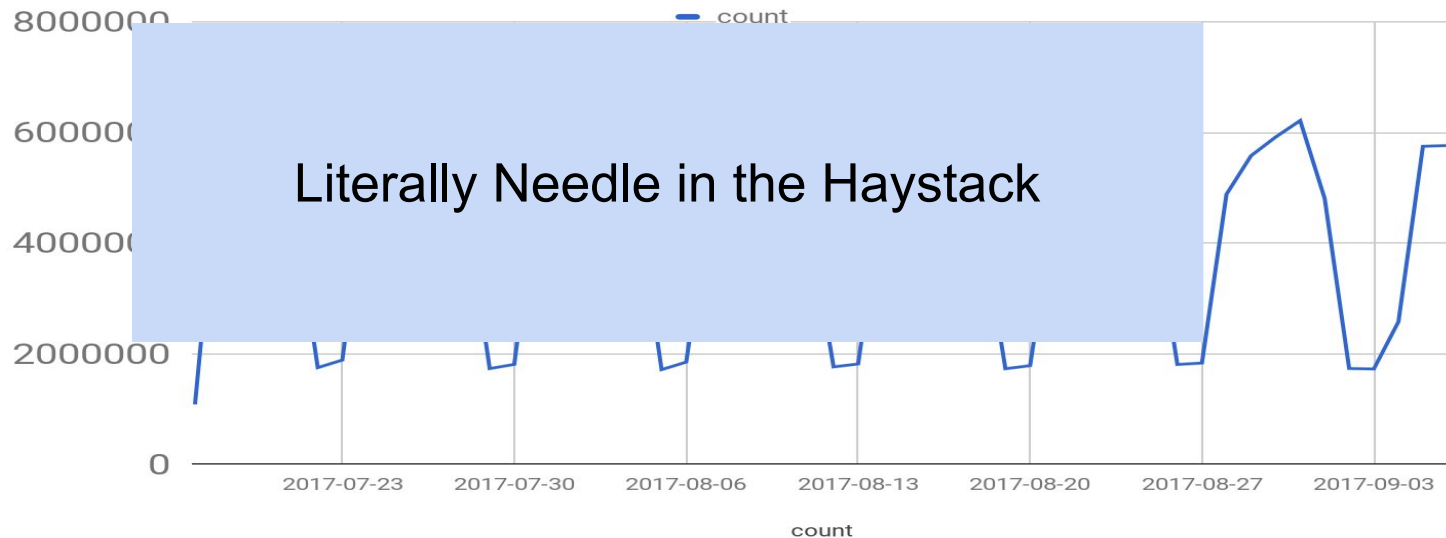


Rough Lame math says each email has at least 10 URLs

That's not even true. Some emails have Lots URLs.

What we seek to find is that **ONE** URLa day ...every day

Number of URLs in Emails Per Day



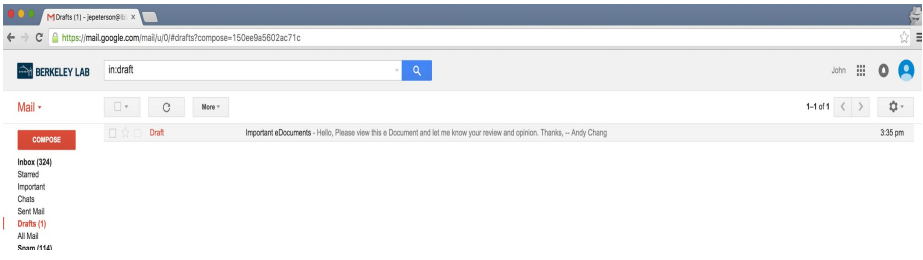
Literally Needle in the Haystack

Time to bring in the Big Guns: Adding
smartness into the system

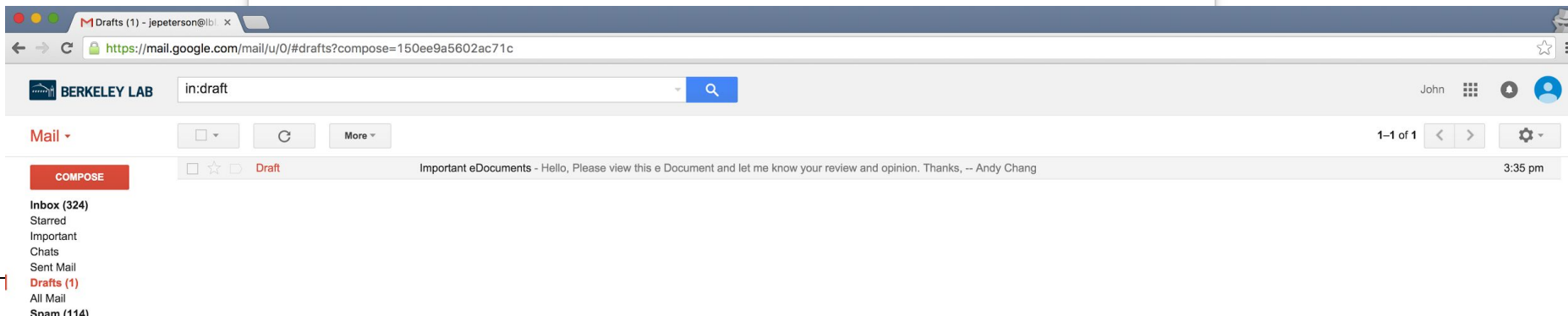
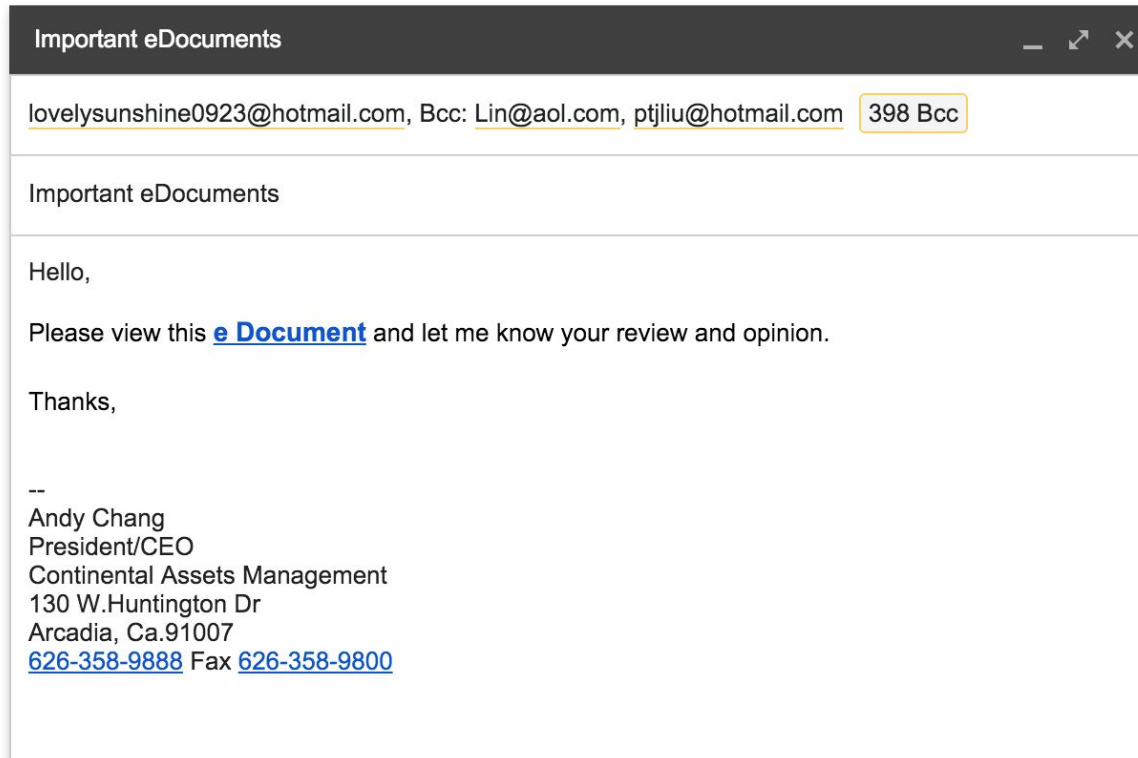
Identifying credentials spearphish

- Current challenges due to base rate issues
 - 500K emails/day @0.1% FP = 500 alerts a day
 - Reality we see is about avg 50-100 smtp-related alerts a day
- Primary Reason is that all the alerting so far is either
 - Lure centric, or
 - Exploit centric

Impersonation Attacks : Spearphish attackers send an email under the identity of a trusted or authoritative entity and include some compelling content in the email to take an action on.

Type of Impersonation	Forge Name	Forge Email	Real Life Example
Address Spoofer	May or may not	YES	<p> Date: Fri, 14 Aug 2015 12:04:00 -0500 (CDT) From: "A Alivisatos" <aalivisatos@lbl.gov> To: XXXXXX@lbl.gov Subject: Good Morning Reply-To: aalivisatoslbl@mail.com </p> <p>Send me the balance on all our accounts as of today's date.</p> <p>Thanks</p> <p>Note</p>
HistoricallyNewAttacker	Unseen Name	Unseen Email (@lbl.gov = forged)	<p> Date: Tue, 08 Nov 2016 17:38:28 +0000 From: Computer Maintenance <compmaint@lbl.gov> To: afXXXXXXXXh@lbl.gov Subject: Urgent: Email reactivation </p>
NameSpoofer	Yes	Yes	<p> From: Steven Chu <david@huismanauction.com> Date: January 9, 2017 at 11:22:42 PM PST To: undisclosed-recipients;; Subject: Steven Chu shared a File with you </p>
Lateral Attacker (Stolen Credentials)	No need to spoof - given account ownership	No need to spoof - given account ownership	

Lateral Attacker

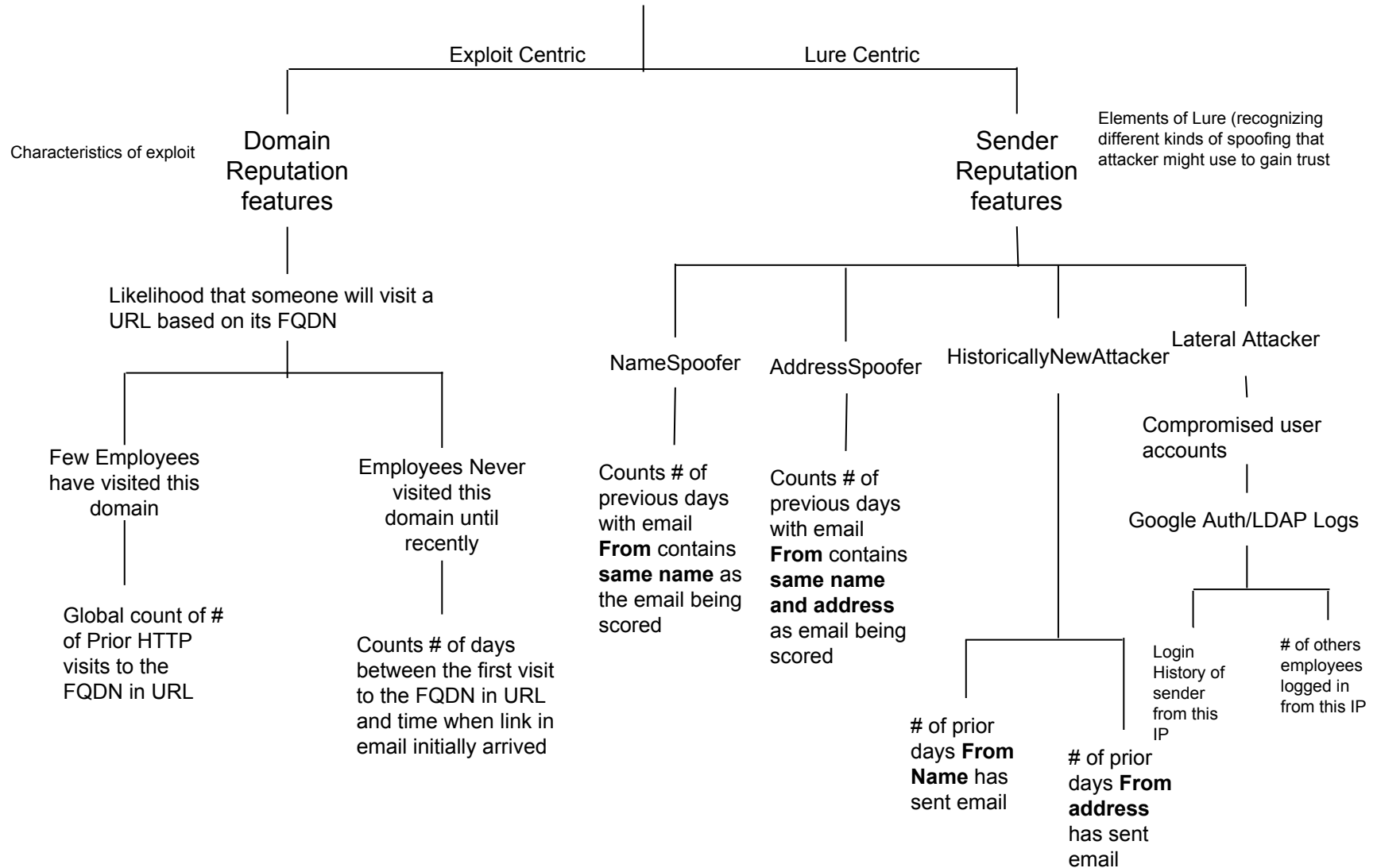


Important eDocuments

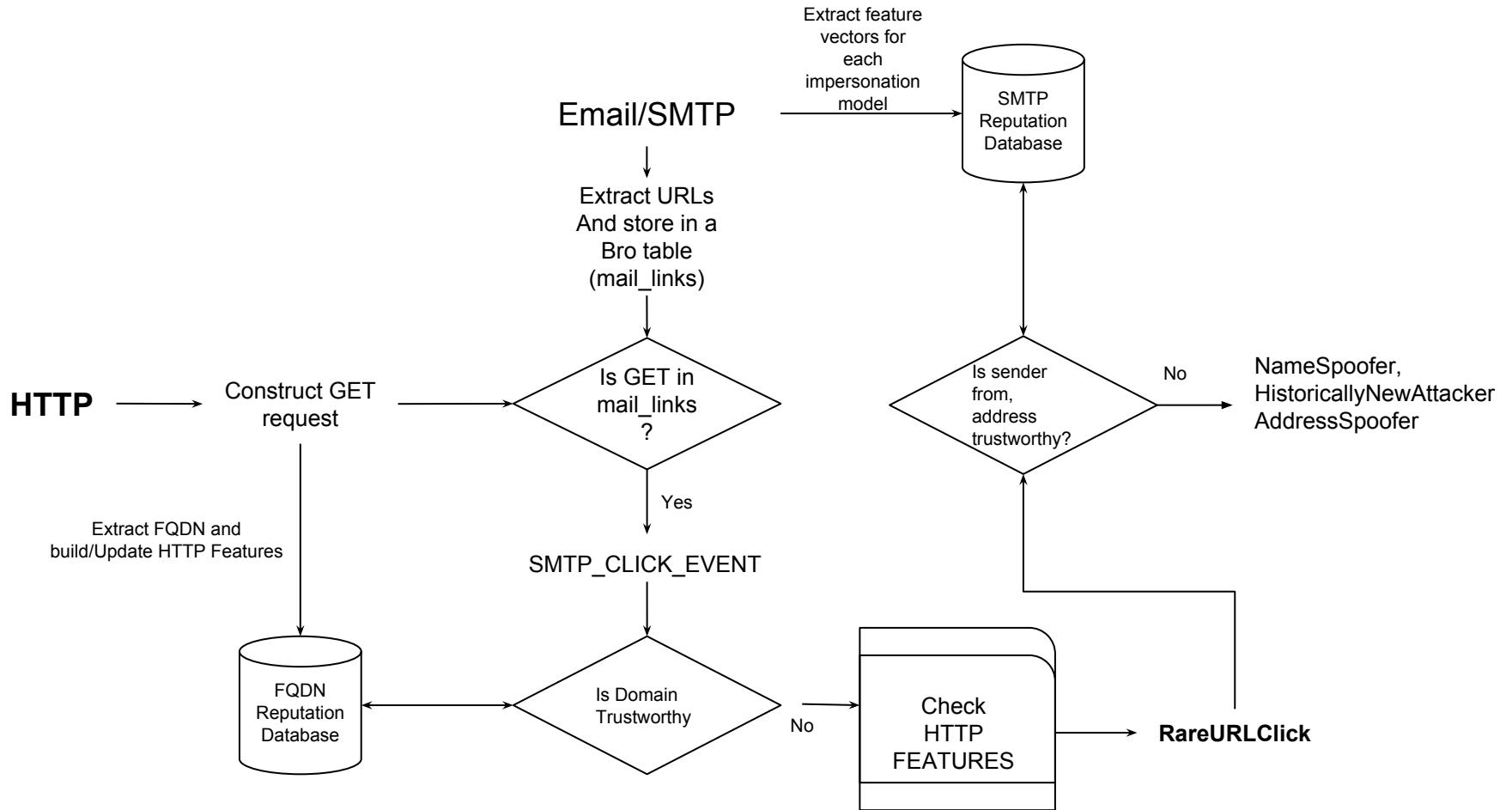
To lovelysunshine0923@hotmail.com ✕

Bcc Lin@aol.com ✕ ptjliu@hotmail.com ✕ ptrendacosta@frandzel.com ✕ ptseng@tpg.com.au ✕ puakailima77@yahoo.com ✕ puikihung@gmail.com ✕ punditcz@yahoo.com ✕ puwiduuxihlo@yahoo.com ✕ Pvspinosa@aol.com ✕
pzia@yahoo.com ✕ qmarty@maui.net ✕ q@bristolyachtinc.com ✕ q@bristolyachtsinc.com ✕ q5jgf-2988665077@hous.craigslist.org ✕ qppkm-2992226341@hous.craigslist.org ✕ supnova@hotmail.com ✕
queenie@cadailyfunding.com ✕ queenie@cafunding.com ✕ queeniecw@hotmail.com ✕ queeniejw@hotmail.com ✕ socalqm@yahoo.com ✕ quickpinnacle@yahoo.com.cn ✕ quidilee@gmail.com ✕ qunyu@yahoo.com ✕
smucker007@gmail.com ✕ rkim1078@hotmail.com ✕ r.cadiz@ymail.com ✕ r.lin@takisun.com ✕ rachelk@jadeescrow.com ✕ Rachel.Cubas@cbre.com ✕ Rachel.Lin@situs.com ✕ rmoore@stantonarchitecture.com ✕
rachelngo1967@yahoo.com ✕ Rachel.Lin@situscompanies.com ✕ radiantchase@yahoo.com ✕ rerobles@msn.com ✕ RAFIKP@glendalenisinf.com ✕ rafsip@aol.com ✕ rahirst@gmail.com ✕ rajji.hanashima@hsbc.co.jp ✕
raj_raman99@yahoo.com ✕ rajiv.trivedi@laquinta.com ✕ chr improvements@gmail.com ✕ ralphdivino@aol.com ✕ rkannan@doheny.org ✕ RamasarA@dwaf.gov.za ✕ ramiaht21@gmail.com ✕ mortpri@cox.net ✕
rappeldorn@opusbank.com ✕ RKirby@ci.arcadia.ca.us ✕ randym@1stvalley.com ✕ randy@indianridgecc.com ✕ rim@warrenmarcus.com ✕ ranty.h.liang@jpl.nasa.gov ✕ rantyliang@aol.com ✕ Ranty.H.Liang@jpl.nasa.gov ✕
saroya12@gmail.com ✕ Ranya.Ku@eastwestinsurance.com ✕ rapittet@usfca.edu ✕ sobalvarro_r@med.usc.edu ✕ belliappa@gmail.com ✕ rwilcox@aranewmark.com ✕ rkham04@yahoo.com ✕ rkhamaguchi@gmail.com ✕
raymcwong@yahoo.com ✕ ray@socalunits.com ✕ raychao@pacbell.net ✕ ray@brei.com ✕ Rbaez@crescentheights.com ✕ rcamire@jbaia.com ✕ rcanalez@hpapts.com ✕ rcarrera@lasc.co.la.ca.us ✕ RCH9876@aol.com ✕
rchaikin@retailadvisorygroup.com ✕ rdantas7@hotmail.com ✕ re@ssinter.com ✕ realesta@islandprodesign.com ✕ realestate@debbiehanna.com ✕ realestate@jasonhoopai.com ✕ realestate@pilottravelcenters.com ✕
rebecca16331@cox.net ✕ Rebecca_lee@cathaybank.com ✕ reed_smileycpa@bookkeepinghelp.com ✕ reegsimpex@gmail.com ✕ reese@loanmarket.net ✕ Regchua07@hotmail.com ✕ reginac329@gmail.com ✕
reichenbaum@sciproperties.com ✕ reinaldo@bennpacific.com ✕ ringmotion@yahoo.com ✕ dhuan@renderholic.com ✕ reneidalaten@yahoo.com ✕ thirtylove19@gmail.com ✕ Renee.Williams@ffslaw.com ✕ rrettally@opusbank.com ✕
Renirose@aol.com ✕ RENOAPT4SALE@aol.com ✕ gacx@earthlink.net ✕ rentals@disounthawaiicarrental.com ✕ reo_database@bankofamerica.com ✕ reoportfolios@yahoo.com ✕ reowalt@earthlink.net ✕
reply_bjfermg_jnwqthi@cp20.com ✕ -402483_HTML-82165558-44478@email.sciprope ✕ -402483_HTML-82165558-44478@email.sciprope... ✕ reservation@thrifty.com ✕ reservation2@998.com ✕ reservations@twobunchpalms.com ✕
resnicka@usc.edu ✕ ReUnion.Alert@max.fairopen.net ✕ toothgap9@yahoo.com ✕ rtacsuan@yahoo.com ✕ reyscar@gmail.com ✕ Reza_Etedali@mail.vresp.com ✕ Reza.Ghaffari@marcusmillichap.com ✕ rfaust@firstam.com ✕
rflebbe@hawaii.rr.com ✕ RFlurry@MARCUSMILLICHAP.com ✕ RFochtman@bernards.com ✕ rgsummers@keyconstruction.com ✕ rhastings@hcbahawaii.com ✕ rhc@lava.net ✕ Rbanuelos@olivermcmillan.com ✕
realestatemall@yahoo.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕ reed@realestate.com ✕

Detector Design: Features per attack stage



Detector Design

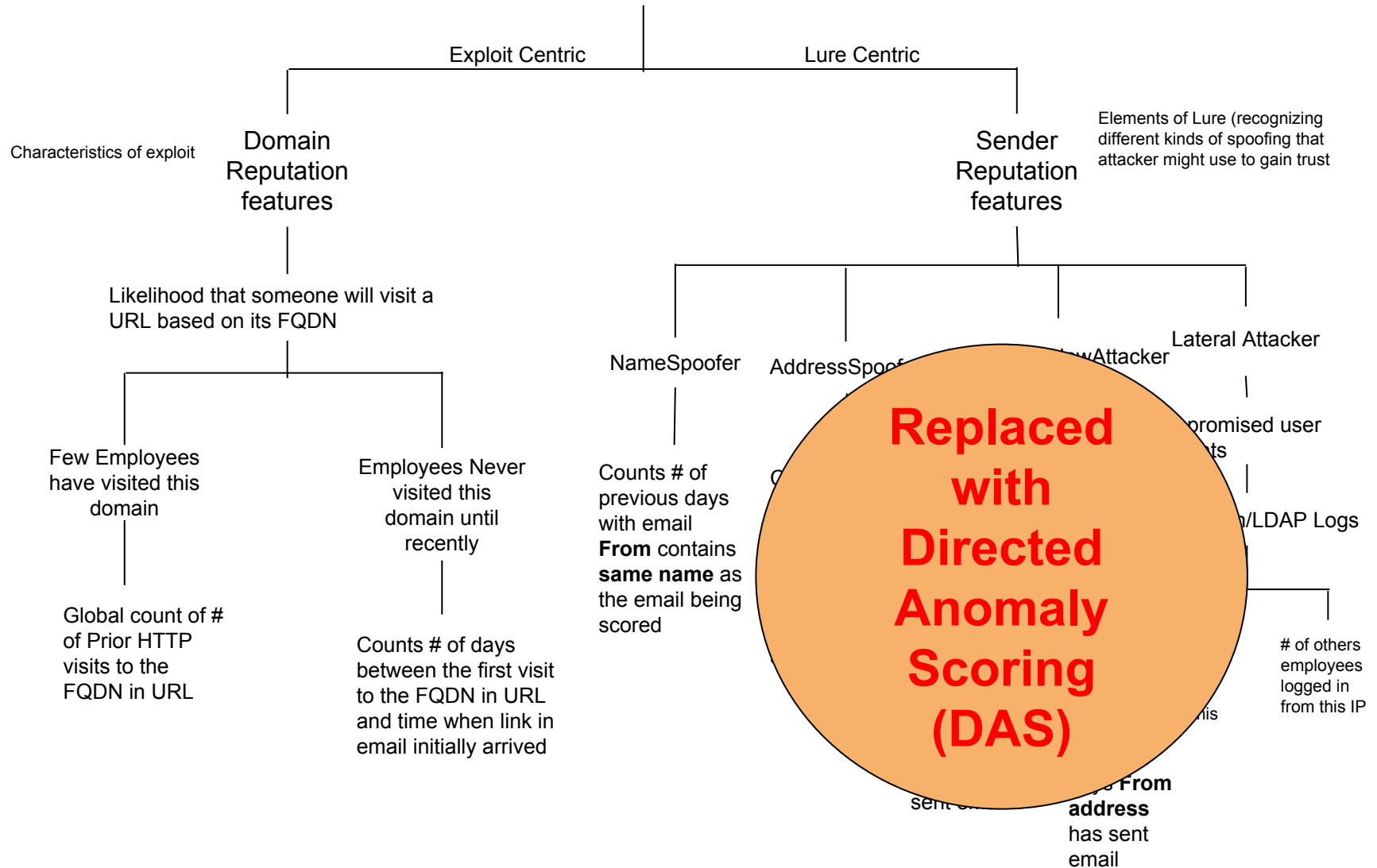


Feature Vectors and comparators per sub detectors

Feature	Description
isRareURLClick	<pre># If a domain has been seen fewer than 3 times in previous HTTP clicks, it is rare. # If a domain has been seen at least 3 times in prior HTTP traffic, and the time of the 3rd visit was more than 3 days ago, it is rare. # Otherwise, it is not-rare.</pre>
isHistoricallyNewAttacker	<pre>if (RareURLClick && *from_name:days_sent <= 2* && *from_email_addr:days_sent <= 2*)</pre>
isSpoofworthyFromName	<pre>SpoofworthyFromName is a boolean OR-clause where: (from_name:days_sent >= 14 from_name:num_clicks > 1 from_name:emails_recv > 1)</pre>
isNameSpoofers	<pre>- if (RareURLClick && *SpoofworthyFromName* && *full_from_field:days_sent <= 1*)</pre>

Final version gets rids of these parameters which is a really nice property

Detector Design: Features per attack stage



TO be Replaced by DAS: Directed Anomaly Score

- Requires no training data
- Operates in non-parametric fashion
- Order of magnitude better performance than standard anomaly detection heuristics

~~# Alerts just too high 272/day~~

Alerts ≤ 10 and make sure those are fast to deal with

(Good read - go.lbl.gov/credphish)

Converting theory into bro scripts

- Domain and sender reputation features demand persistence (~14 days of buildup)
- Optimize URL storage in BRO given we've got ~600,000 URLs per day
- In short this all means bro cannot crash (..... or restart :)

Bro+Postgres

```
# bro -N Johanna::PostgreSQL
```

```
Johanna::PostgreSQL - PostgreSQL log writer and input reader (dynamic, version 0.1)
```

Available as Bro-Package and at: <https://github.com/0xxon/bro-postgresql>

```
Postgres Plugin Automatically creates tables and scheme
```

```
Smart to translate Bro's native data types into Postgres and back (both r/w)
```

Bro records <-> Postgres tables

Bro Script

```
type fqdn_rec : record {  
  domain: string ;  
  days_visited: vector of time ;  
  num_requests: count &default=0;  
  last_visited: time ;  
  trustworthy: bool &default=F;  
} &log ;
```

```
global http_fqdn: table[string] of  
fqdn_rec &write_expire=10 days;
```



Postgres DB

```
=> \d http_fqdn
```

Table "public.http_fqdn"		
Column	Type	Modifiers

id	integer	not null default
domain	text	
days_visited	double precision[]	
num_requests	integer	
last_visited	double precision	
trustworthy	boolean	

Indexes:

```
"http_fqdn_id_key" UNIQUE CONSTRAINT, btree (id)  
"domain_idx" btree (domain)
```

```
lbl.gov.invoicenotices.com - [days_visited=[1481051156.986024, 1481062180.295358],  
num_requests=48, last_visited=1481062276.631609, interesting=T]
```


Design Decisions

- Size of mail_links table and ability to track URLs over days
 - Convert to bloomfilter
 - Problem: Loose the mail_info relation
 - Solution: Fetch mail_info from postgres store
- Should we track every URL or be selective
 - .gif, .jpeg, .png

Problem: Postgres storage works a bit too good

Having more data in storage tables than you need - 25M URLs in 43 days

- Previously we'd struggle to store URLs for 4hrs or 12 hrs in a table
- Limit it to 30 days

Design decisions for fqdn reputation

Optimization	Problem
If we see fqdn_domain in mail_links update the http_fqdn by reading database, unless it's already in table	<ul style="list-style-type: none">- Way too many DB queries- We may not even have a 'click'
Read everything from fqdn database and fill up the table	<ul style="list-style-type: none">- Too much data- Not quite useful to keep everything in table
Create a trusted_db bloom and untrusted fqdn's go into a table Expire untrusted fqdn's after N days	<ul style="list-style-type: none">- Graduating untrusted to trusted syncs- What is that 'N'

Jumpstarting reputation code

<https://github.com/initconf/reputation-db-scripts-for-phish-analysis>

- When starting to run code from scratch we need to have a reputation database built
- Bro takes at last 2 weeks to build it
 - Until then HUGE number of false positives which reduce per day
- So, we've got two Python scripts which read historic logs and populate reputation database

Challenges

- Postgres database design
 - Non-normalized data
 - Only INSERT and no UPSERT
 - Using adhoc workarounds, for now
 - Delete all but last inserted record
- Operational Problems
 - Cannot get it running on 50 worker 5 box cluster
 - 400GB process size
 - Works perfectly awesome on 20 worker 1 cluster-in-a-box

How is it working for LBNL

- Code is mostly working stable
- Credential spearphish
 - Implementation in Intermediary stage of research paper.
 - Running semi-production state
 - **Need to incorporate Directed Anomaly Scoring (DAS)**

Promising Results

FY17 Performance Review Problem



Inbox x

ASHARMA x



 **Ingrid Peters** <ipeters@lbl.gov>

12:41 PM (18 hours ago) ☆

to me ▾




Image

from: **Ingrid Peters** <ipeters@lbl.gov>

to: asharma@lbl.gov

date: Mon, Sep 11, 2017 at 12:41 PM

subject: FY17 Performance Review Problem

 : Important mainly because of the people in the conversation.

pdf FY17 Performance
Review.pdf

attachment

So we've got URLs

Sep 11 12:41:36	CnLB3L2YytKN8F3Lnh	52.1.96.230	64784	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/[UNIQUE_TOKEN
Sep 11 12:41:40	C5zzYt3Jo7C8jVPfUc	52.1.96.230	37930	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/08c7efbc-2a72-4b56-971d-
Sep 11 12:41:40	C5WwVF0BamWSXQeo6	128.3.41.71	47299	108.177.112.26	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/53b53878-7f0c-4a9c-830d-
Sep 11 12:41:41	Ce5zZ82fPqMGJ2nHsh	128.3.41.71	17199	108.177.112.26	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/08c7efbc-2a72-4b56-971d-
Sep 11 12:41:43	C18wAK3LeeX0Ddw3d3	128.3.41.68	16678	74.125.135.27	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/[UNIQUE_TOKEN
Sep 11 12:41:51	Ce5zZ82fPqMGJ2nHsh	128.3.41.71	17199	108.177.112.26	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/1c7b0520-5719-477d-80c9-
Sep 11 12:41:52	Ce5zZ82fPqMGJ2nHsh	128.3.41.71	17199	108.177.112.26	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 19:33:09	CyuaWo1swks7yqTo1a	209.85.215.71	37814	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 19:33:10	CxFkKb38v11QN3L09h	128.3.41.71	28232	108.177.98.27	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:08	CFAUQp1v2JaxY97pq8	209.85.215.71	38902	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:08	CFAUQp1v2JaxY97pq8	209.85.215.71	38902	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:08	CFAUQp1v2JaxY97pq8	209.85.215.71	38902	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:08	CFAUQp1v2JaxY97pq8	209.85.215.71	38902	128.3.41.120	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/53b53878-7f0c-4a9c-830d-
Sep 11 22:02:07	CP1Ygb2yuspXyo6ZX7	128.3.41.71	37900	173.194.202.27	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:07	CP1Ygb2yuspXyo6ZX7	128.3.41.71	37900	173.194.202.27	25	downloads.careerpost.us	http://downloads.careerpost.us
Sep 11 22:02:07	CP1Ygb2yuspXyo6ZX7	128.3.41.71	37900	173.194.202.27	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-
Sep 11 22:02:07	CP1Ygb2yuspXyo6ZX7	128.3.41.71	37900	173.194.202.27	25	downloads.careerpost.us	http://downloads.careerpost.us/e1006c/53b53878-7f0c-4a9c-830d-

Alerts

2017-09-11-19:29:50 CWnRow2SReNVDJOCnd 131.243.223.32 52451 54.236.212.118 80 tcp

Phish::RareURLClick

<http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-926ee75f7926/?####>

[ts=1505158912.44534, uid=Ce5zZ82fPqMGJ2nHsh, from=Ingrid Peters <ipeters@lbl.gov>, to=asharma@lbl.gov, subject=FY17 Performance Review Problem, referrer=<uninitialized>]####

[domain=downloads.careerpost.us, days_visited=[1504909578.01473, 1505156245.335107], num_requests=0, last_visited=1505183380.538836, trustworthy=F] -

131.243.223.32 54.236.212.118 80 - worker-22 Notice::ACTION_LOG 3600.000000 F

2017-09-11-19:29:50 CWnRow2SReNVDJOCnd 131.243.223.32 52451 54.236.212.118 80 tcp

Phish::HistoricallyNewAttacker

<http://downloads.careerpost.us/e1006c/20870d7a-3f72-4da3-953b-926ee75f7926/?####>

[ts=1505158912.44534, uid=Ce5zZ82fPqMGJ2nHsh, from=Ingrid Peters <ipeters@lbl.gov>, to=asharma@lbl.gov, subject=FY17 Performance Review Problem, referrer=<uninitialized>]####

[domain=downloads.careerpost.us, days_visited=[1504909578.01473, 1505156245.335107], num_requests=0, last_visited=1505183380.538836, trustworthy=F]

131.243.223.32 54.236.212.118 80 - worker-22 Notice::ACTION_LOG 3600.000000 F

More example alerts

Date: Fri, 8 Sep 2017 02:38:04 -0700 (PDT)

From: bro <bro@bro.lbl.gov>

To: test@lbl.gov

Subject: [Bro] Phish::RareURLClick

Connection: CjjBiP3hSjeclpFKIa, [orig_h=128.3.5.17, orig_p=39017/tcp, resp_h=107.21.6.90, resp_p=80/tcp]

SMTP:: [ts=1481050626.364467, uid=Ch12mp1noGiPWMwtne, from=Frank Zuidema <fzuidema@lbl.gov>, to=xxxxx@lbl.gov, subject=Document review - Invitation to edit, referrer=[]]

HTTP:: [domain=lbl.gov.invoicenotices.com, days_visited=[1481051156.986024], num_requests=24, last_visited=1481051156.986024, trustworthy=F]

Clicked URLs:

http://lbl.gov.invoicenotices.com/0cb548/?login_id=c25acd74-aed4-43f3-89a5-563a03a0d9cc

Example Alert-2

Subject: [Bro] Phish::RareURLClick

Connection: [orig_h=128.3.153.65, orig_p=50212/tcp, resp_h=93.88.255.126, resp_p=80/tcp]

SMTP:: [ts=1504523783.99904, uid=Cp0tuI2Hz7lEUKzODj, from="Training FSRM" <training@fsrm.ch>, to="XXXXXX YYYY" <XXXXXXYYYY@lbl.gov>, subject=Next FSRM courses (Attn. XXXXXX YYYY), referrer=<uninitialized>]

HTTP:: [domain=www.fsrn.ch, days_visited=[1503420632.37621, 1504864837.885044], num_requests=0, last_visited=1504864837.886409, trustworthy=F]

Clicked URLs:

<http://www.fsrn.ch/gfx/social/In-2C-28px-TM.png>

<http://www.fsrn.ch/gfx/social/YouTube-logo-30.png>

http://www.fsrn.ch/gfx/social/FB-f-Logo__blue_29.png

How to get smtp-url-analysis running

```
$ bro-pkg install smtp-url-analysis
```

The following packages will be INSTALLED:

```
bro/initconf/smtp-url-analysis (master)
```

```
Proceed? [Y/n] Y
```

```
Running unit tests for "bro/initconf/smtp-url-analysis"
```

```
all 8 tests successful
```

```
Installing "bro/initconf/smtp-url-analysis"....
```

```
Installed "bro/initconf/smtp-url-analysis" (master)
```

```
Loaded "bro/initconf/smtp-url-analysis"
```

Questions ?

security@lbl.gov

SMTP Detection with Bro

