#### An Empirical Study of Spam Traffic and the Use of DNSBLs

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#### What are DNS Black Lists?

- Lists of hosts (IP address) that might send you spam.
- Checked via DNS when mail is being received. e.g.,
  - Upon connection from 219.251.61.45,
  - check if 45.61.251.219.bl.spamcop.net exists.
  - If yes, respond with SMTP error, and disconnect.

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  - If yes, respond with SMTP error, and disconnect.
- Different lists have different focus:
  - Open Relays (e.g. list.dsbl.org)
  - Known spam sources (e.g. sbl.spamhaus.org)
  - **Countries or ISPs (e.g.** china.blackholes.us)
  - **Composite lists** (e.g. dnsbl.sorbs.net)

## **Investigating DNSBLs**

- What does DNSBL usage look like?
  - How much DNSBL traffic is there?
  - What impact does this have on DNS?
- How effectively can DNSBLs be?
  - Do DNSBLs identify spam sources?

#### **Data Collection**



- Analyze DNS packets and TCP SYN/FIN/RST traffic,
- At border of CSAIL and the rest of the world.

# **Characterizing Black List Usage**



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- Median latency is 84ms (vs 89ms in 2000).

## **Estimating DNSBL effectiveness**

- DNSBLs are effective if they list all spam sources.
- We will estimate hit rate by:
  - Identifying potential spam sources in trace.
  - Testing for membership in popular DNSBLs.

#### **Profile of SMTP connections**

	7 Dec 2000	19 Feb 2004
Total attempted SMTP connections	29,303	787,231
Successful SMTP connections	24,790	324,134
Rejected SMTP connections	4,513	463,097
Remote hosts initiating SMTP	4,334	76,676
Remote hosts initiating rejected SMTP	79	7,970
Local hosts rejecting SMTP	19	90

- Can we distinguish spam sources from mail sources?
- Majority of connections to hosts without SMTP server.

## **Source of rejected connections?**

- Possible reasons for rejected connections:
  - Port scanners. (Very few.)
  - People trying to send mail.
- 70% of connections rejected to one host:
  - Host is listed as mail exchange for *unused* domain:
  - no legitimate recipients on machine.
  - Mail is to made-up addresses (spam) or bounces.

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- Assume all hosts rejecting connections also get spam.
- (This underestimates number of spam sources.)

# How many do DNSBLs list? (1)

	Dec 2000	Feb 2004
Total spam sources	100	14,090
Listed by:		
cbl.abuseat.org	0	1,401
list.dsbl.org	5	7,624
opm.blitzed.org	0	122
ipwhois.rfc-ignorant.org	25	2,030
dnsbl.sorbs.net	3	8,529
bl.spamcop.net	0	496
sbl.spamhaus.org	2	1,123
Total unique hosts black-listed	34 (34%) 🔇	11,521 (82%)

- Checked in March 2004...
- Do DNSBLs react faster?

## **Collecting and annotating spam**

- Supplement traces with active collection.
  - Set up a machine dedicated to receiving spam ("spam trap").
  - Annotate all spam received with black-list checks.
- Collected spam from 5 Aug 2004 to 8 Oct 2004.
  - Detected > 43,000 spam sources.
  - Received 136,206 spam messages.

# How many do DNSBLs list? (2)

- 98% of sources are listed when they first arrive.
- Some sources become listed/delisted over time:
  - 80% of all sources listed at some point.
- Unlisted sources send 30% of spam.
- Could DNSBLs do better?

## **Spam arrival rates**

Begin: Thu Aug 5 02:50:32 2004 End: Fri Oct 8 00:46:30 2004 messages unique spammers count per hour 1008 1176 1344 1512 1680 time (hour) Number of spam sources tracks number of spams.

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- Spam sources tend to be low volume.
- 20% of spam from hosts that send 1 message.
- These hosts may be harder to black list.

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#### Conclusions

- Spam is now an important driver of DNS lookups.
- **DNSBLs** appear to block  $\approx$  80% of spam sources.
  - Black lists may not adapt well to one-shot sources.
  - Limits potential utility of DNSBLs.

# **Questions?**