

Role Model Transformations for Flow Analysis in Cyberdefense

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Metrics and Analytics

- **2012 Packet Dynamics**
 - Leveraging protocols and human factors
- **2014 Producer/Consumer Ratio**
 - Characterizing data flow across scales
- **2015 ASNs and Flow Locality**
 - Enriching “netography” in flow
- **2016 Orientation and Degree**
 - The view from where you sit

Classic Flow Orientation and Role

- **Orientation**
 - Packet Src / Dst Addresses
- **Role**
 - Client/Server
 - By convention – first packet seen
 - By context – “well-known” port numbers
 - Derived or inferred from above

Cyberdefense Tasks

- **Situational Awareness**
 - Summarize “the view from here”
 - Which ways are data flowing?
 - What roles are evident?
- **Incident Response / Forensics**
 - Focus on flow sequences and semantics
 - Who have suspect machines been talking to?
 - Can we pivot our viewpoint?

Identifying Roles

- **Across Control/Data/Management Planes**
 - Client/Server
 - Master/Slave
 - Peer-to-Peer
 - Pub/Sub
- **Behavioral Domains**
 - Not just Src/Dst -- Location of actors is critical
 - Producer/Consumer
 - Importer/Exporter
 - It's mostly “us versus them”
 - North/South
 - Although “them” may be internal
 - East/West

Locality Layers

- **Every IP has a locality**

Either the enterprise ASN – or the remote ASN

$\text{srcASN} = \text{ASmap}[\text{srcIP}]; \text{dstASN} = \text{ASmap}[\text{dstIP}]$

- **Every flow has a locality**

(**Let** uni={? unicast dstIP}; **then** locality:= uni *(uni + (srcASN == dstASN))

0: non-unicast

1: unicast from outside enterprise

2: enterprise unicast from outside observation point

(optionally)

3+: additional east/west granularity inside organizational units

Calculating Flow Locality

- **Every Flow acquires a locality from its IPs**
 - Compare locality value of SrcIP and DstIP
 - **Lower** value is the value for the flow
- **Example: DNS lookup via Google**
 - SrcIP = 172.17.1.34 (locality = 2)
 - DstIP = 8.8.8.8 (locality = 1)
 - Flow locality = 1

Flow Degree

- **Summarize Orientation and Data Exchange**
Capture the local perspective on communication
- **Sign gives direction of first packet**
 - + : Local IP (outbound)
 - : Remote IP (inbound)
- **Exchange depth (decreasing order)**
 - 3 : Payload exchange in both directions
 - 2 : Packet exchange in both directions
 - 1 : One-way packets
 - 0 : Nonsensical (for bi-directional flows)

Flow Degree Values

- 3: Local client exchanged payloads
- 2: Local client exchanged packets
- 1: Local client sent ignored packets
- 0: Nonsensical
- 1: Local server ignored packets
- 2: Local server exchanged packets
- 3: Local server exchanged payloads

Degrees – Good, Bad, and Ugly

3 : Local client exchanged payloads with remote server

- Lookup at Google Public DNS
- Data exfiltration via DNS to Ukranian domain

2 : Local client exchanged packets with remote server

- Normal exchange of ACKs with Amazon web server
- Heartbeat sent to Dutch C&C server

1: Local client sent ignored packets to remote address

- Connect fails to offline webserver at non-profit
- Compromised laptop in marketing scanning DOE lab

0: Nonsensical

- DDOS backscatter (SYN/ACK, NTP spoof, ...)

-1: Local server ignored packets from remote address

- Host firewall silently drops Brazilian RDP troll
- Compromised desktop receives “port-knock” packet from asian IP

-2: Local server exchanged packets with remote client

- FIN/ACK during web server TCP session teardown
- ACK sent during DDOS SYN flood

-3: Local server exchanged payloads with remote client

- Mail server accepts inbound Greek e-mail for local user
- Web server compromised by SQL injection from Romanian IP

Transforms

- **Definitions**

F.direction =: SIGN(F.degree)

F.locindex =: (1 = F.dir ? 0: 1)

- **Addresses**

Lip=: (Sip,Dip)[F.locindex] Sip=: (Lip,Rip)[F.locindex]

Rip=: (Sip,Dip)[~F.locindex] Dip=: (Lip,Rip)[~F.locindex]

- **Metrics**

- Producer/Consumer Ratio (1.0 to -1.0)

- PCR=: (Spayload-Dpayload)/(Spayload+Dpayload)

- Export/Import Ratio (1.0 to -1.0)

- XIR=: (Lpayload-Rpayload)/Lpayload+Rpayload)

- Relationship

- XIR = F.direction * PCR

Implementation at Stanford EE/CS

- **Observation point**
 - Layer 2 entry point switches of three buildings
 - Argus sensor creating bi-directional flows
- **Topology**
 - Four dozen VLANs shared across buildings
- **Locality definition**
 - 0, 1, 2, VLANid

Classic Flow Storage

- Archives for batch analysis
 - Flat flow files organized by sensor
 - Sequentially time-sequenced
- Relational DB for interactive queries
 - Tables partitioned by date/time
 - Indexed by Src IP, Dst IP, Dst Port

Enhanced Database Organization

- **Addresses**
 - Store both Src/Dst and Lcl/Rmt
 - Rmt ASN
- **Degree + Locality**
 - For each flow store Degree + Locality
- **Indexing**
 - Lcl/Rmt IPs
 - Dst port, ASN, VLAN

Situational Awareness Queries

- Aggregate traffic by date for last 96 hours

```
q)select f:count i, count distinct l_ipn, count distinct r_ipn, xir:avg pcr*signum role, sum t_ab by date from flow where date within 2015.06.23 2015.06.26
```

date	f	l_ipn	r_ipn	xir	t_ab
2015.06.23	9241197	6057	69320	0.22	3049916808392
2015.06.24	7833157	6096	63296	0.277	495980015533
2015.06.25	8083707	5976	59831	0.279	360244608240
2015.06.26	8365180	6038	56958	0.28	1988082088281

- Today's traffic by flow degree

```
q)select f:count i, count distinct l_ipn, count distinct r_ipn, xir:avg pcr*signum role, sum t_ab by deg from flow where date=2015.06.26
```

deg	f	l_ipn	r_ipn	xir	t_ab
-3	719903	616	18933	0.239	939859443721
-2	1131111	611	9625	-0.235	2070257797
-1	179180	4916	11756	-0.61	40699133
0	23377	188	943	0	14913012
1	3016053	3516	14408	0.961	28581829274
2	775767	937	16088	0.228	53623522525
3	3537789	1395	22515	-0.217	963891422819

Situational Awareness Queries

- Show dataflow for top remote hosts

"Top Remote (excluding Google, Amazon, Yahoo)"

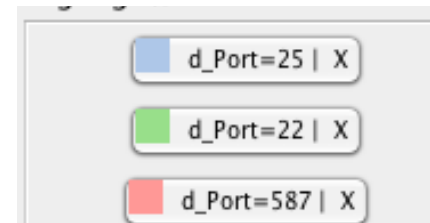
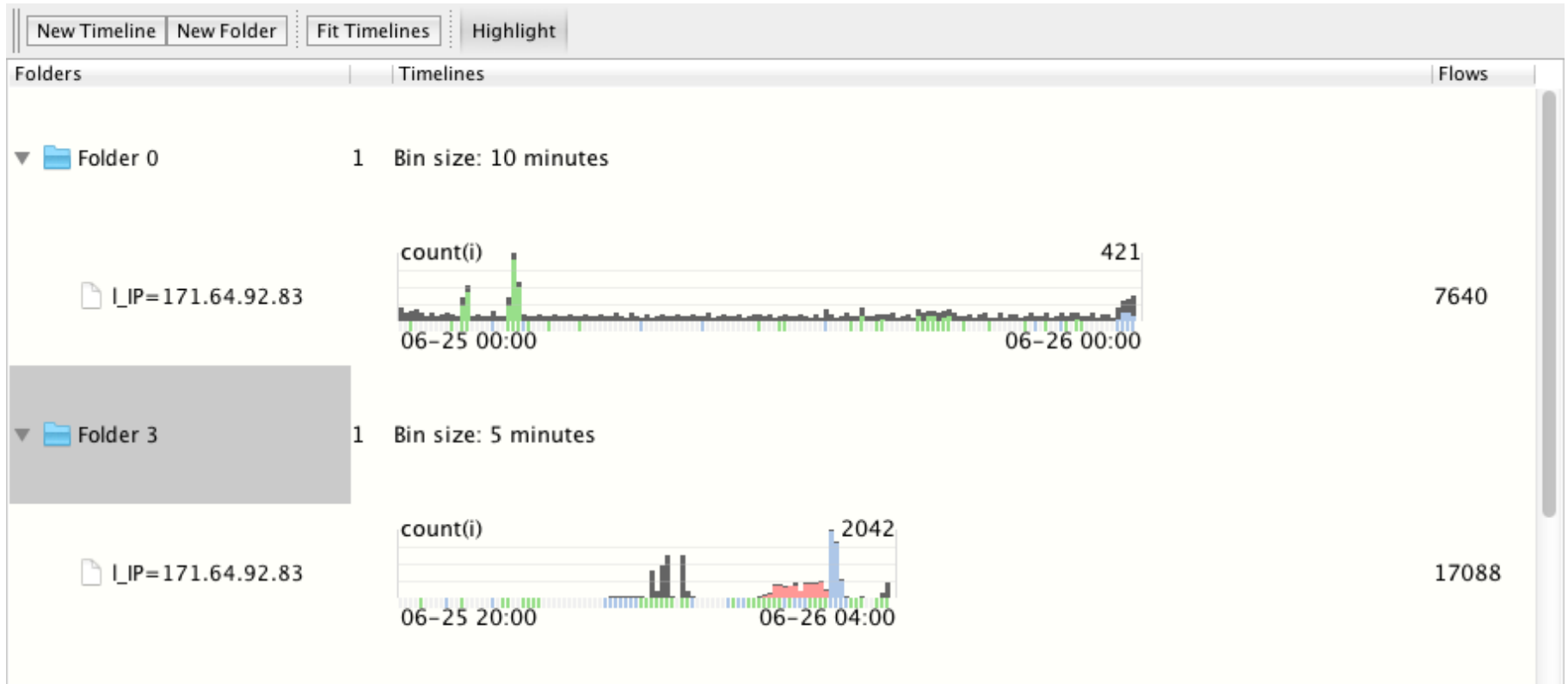
asn	ripn	nlip	tot	xi	begin	recent
45899	113.160.41.218	1	1126982	0.974	00:00	18:04
36375	141.212.109.57	2	313645	-0.369	00:00	18:04
27385	64.39.103.75	1	218670	0.625	04:59	16:14
21581	108.161.147.110	47	143908	0.318	00:00	18:04
24940	136.243.74.81	2	135902	-0.999	00:00	18:04

Incident Handling

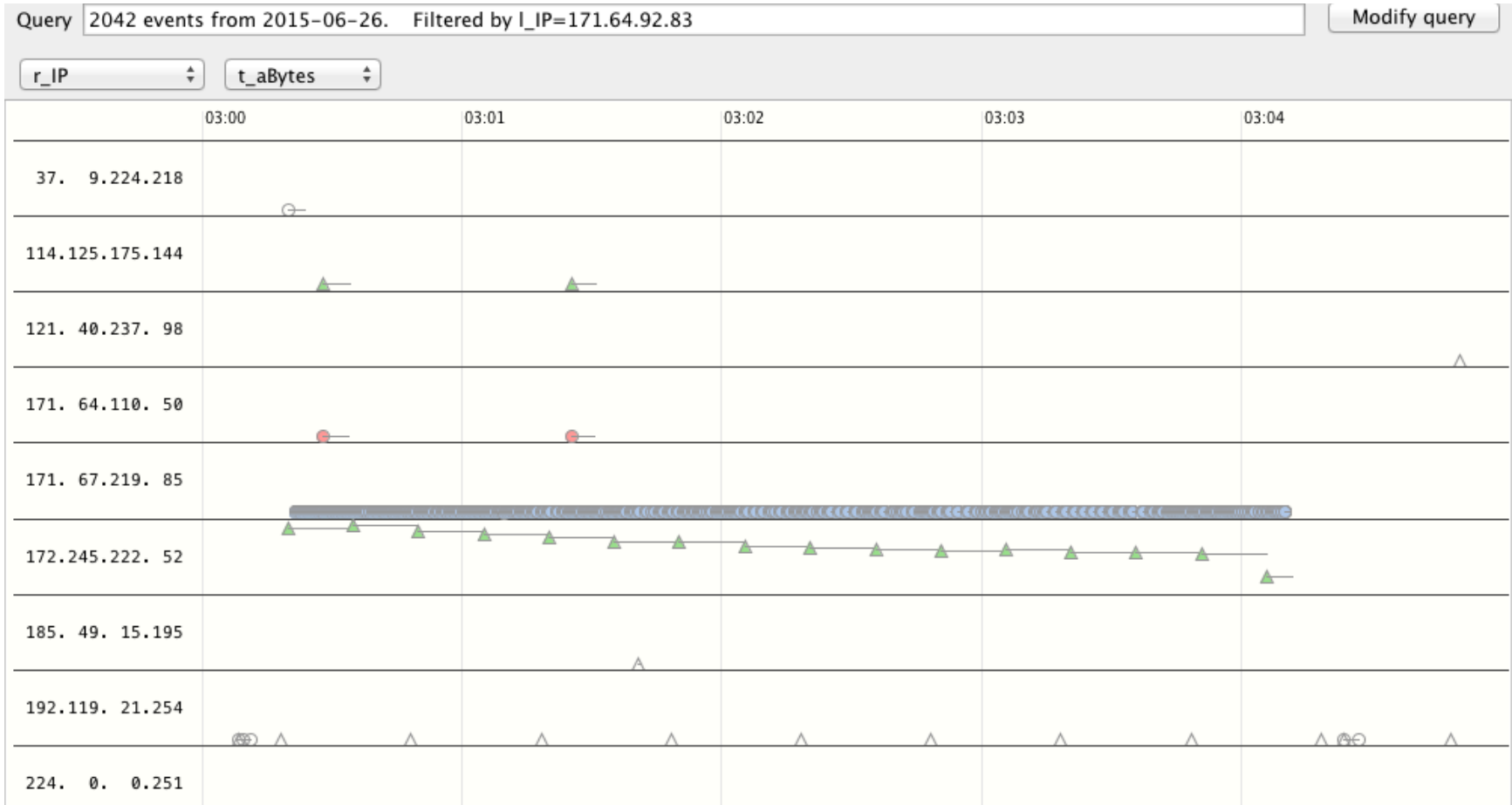
```
q)select f:count i by date from flow where date within 2015.06.21 2015.06.26,l_ipn=ipi `171.64.92.83
date      | f
-----|-----
2015.06.21| 7716
2015.06.22| 8646
2015.06.23| 7721
2015.06.24| 10121
2015.06.25| 7640
2015.06.26| 104374
```

```
q)select f:count i by loc,deg from flow where date=2015.06.26,l_ipn=ipi `171.64.92.83,(abs loc)in 1 2 3h
loc deg | f
-----|-----
1  -3 | 6255
1  -2 | 245
1  -1 | 247
1   0 | 94
1   1 | 480
1   2 | 65
1   3 | 501
2  -2 | 1
2  -1 | 38
2   1 | 1383
2   2 | 247
2   3 | 82846
```

Intrusion Timelines



Intrusion Detail



Summary

- **Enabling Additional Perspectives**
 - North/South and East/West
 - Export/Import, Depth, and Pivot
- **Future work**
 - Developing robust role signatures
 - Turning flow sequences into behaviors
 - Models of expected roles and behaviors