



# ESnet

ENERGY SCIENCES NETWORK

# ESnet High-Touch Telemetry Platform

Chin Guok  
Chief Technology Officer  
Scientific Networking Division  
Lawrence Berkeley National Laboratory

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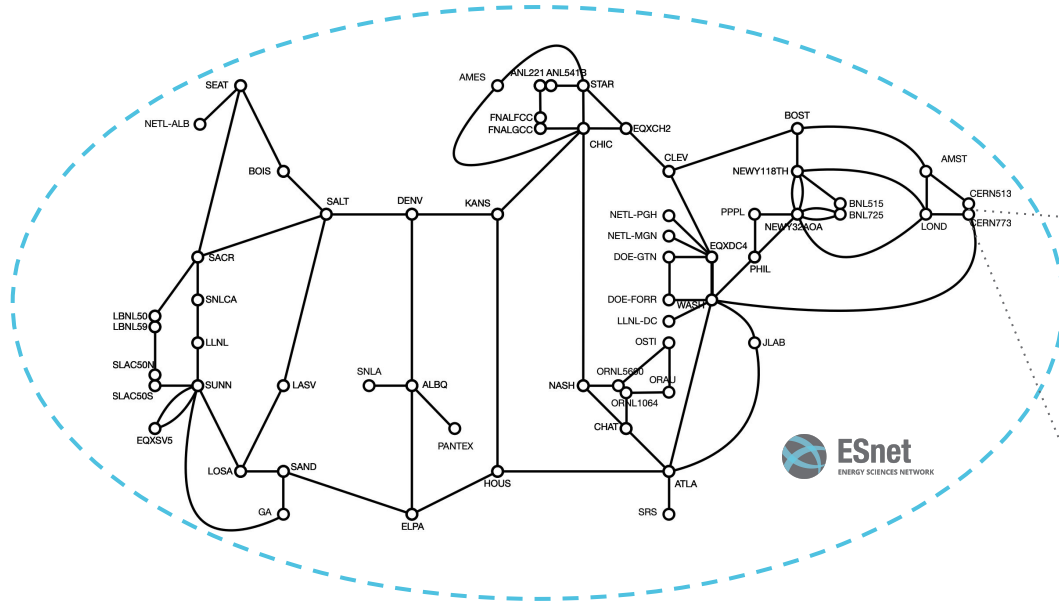


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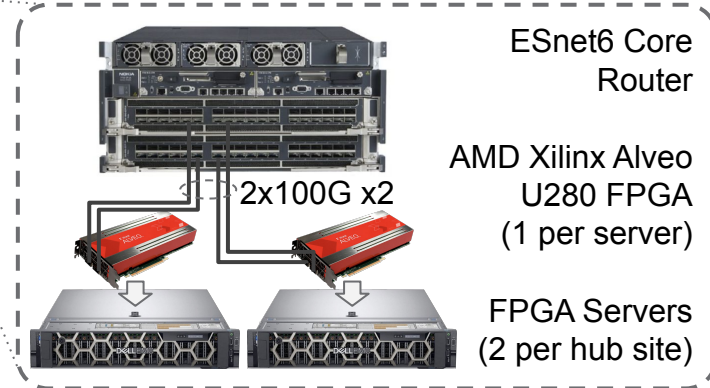
Office of Science



# ESnet6 High-Touch Platform Field Deployment



## High-Touch Server Hardware Deployment



- 42 deployment locations
- Near 100% perimeter coverage\*
- 100% packet inspection

\*NB: Certain ports are omitted due to security sensitivities.



# ESnet6 High-Touch System Deployment

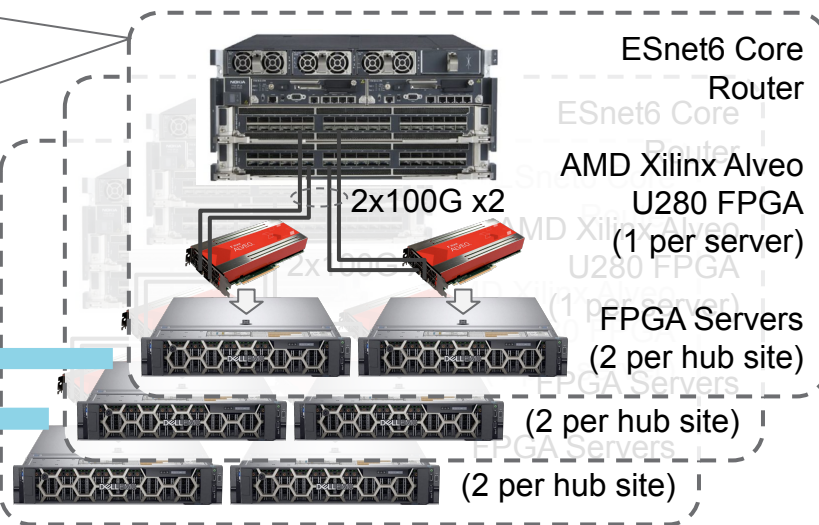
## High-Touch Platform

- Router packet mirroring with (128 byte) packet truncation at line rate
- FPGA accelerated data reduction that can process up to 300Mpps
- FPGA 1ns accuracy time stamping
- Kafka based 24/7 streaming central database (data lake)
- PCAP capture of any subset of flows

## High-Touch Data Lake

- 2PB Fast SSD + CEPH
- Column-oriented (SQL) database (ClickHouse)
- Built to handle trillions of rows, petabytes of data

## High-Touch Server Hardware Deployment



# Flexibility in Tool Selection

## Jupyter Lab / Pandas

```
[9]: # Quick preview to see what the data frame looks like
df.drop_duplicates(subset='flow_id')
```

[9]:	dst	dport	src	sport	proto	time	dst_org	src_org	src_network	dst_network	flow_id
0	104.196.237.25	42948	198.129.224.35	80	6	2022-02-15T11:09:59.994-0800	UNDEF	ESNET	198.129.224.0/24	104.196.237.0/24	1
1	134.79.146.247	34432	45.137.21.208	48138	6	2022-02-15T11:09:59.984-0800	SLAC	UNDEF	45.137.21.0/24	134.79.146.0/24	2
2	134.79.25.243	33566	92.63.196.25	47014	6	2022-02-15T11:09:59.974-0800	SLAC	UNDEF	92.63.196.0/24	134.79.25.0/24	3
3	198.128.14.236	48690	198.124.155.24	22	6	2022-02-15T11:09:59.974-0800	ESNET	ESNET	198.124.155.0/24	198.128.14.0/24	4
4	128.3.18.26	53422	128.55.136.54	27017	6	2022-02-15T11:09:59.964-0800	LBNL	NERSC	128.55.136.0/24	128.3.18.0/24	5
...	...	...	...	...	...	...	...	...	...	...	...
166483	128.55.244.94	50264	89.248.168.172	56292	6	2022-02-15T10:20:00.504-0800	NERSC	UNDEF	89.248.168.0/24	128.55.244.0/24	86741
166484	131.225.205.56	34749	128.55.224.115	57714	6	2022-02-15T10:20:00.474-0800	FNAL	NERSC	128.55.224.0/24	131.225.205.0/24	86742
166487	84.220.141.235	57150	128.55.206.106	443	6	2022-02-15T10:20:00.404-0800	UNDEF	NERSC	128.55.206.0/24	84.220.141.0/24	86743
166493	128.55.109.9	15529	112.31.169.97	4183	6	2022-02-15T10:20:00.093-0800	NERSC	UNDEF	112.31.169.0/24	128.55.109.0/24	86744
166494	198.129.217.96	57599	173.194.152.170	443	17	2022-02-15T10:20:00.083-0800	SLAC	UNDEF	173.194.152.0/24	198.129.217.0/24	86745

86745 rows x 11 columns

## SQL CLI

```
SELECT
  exporting_node,
  count(*) AS total_records
FROM ht_all_flows
GROUP BY exporting_node
FORMAT PrettyCompactMonoBlock
```

Query id: 3101a6b0-9ae6-4e94-b78c-d

exporting_node	total_records
bnl515-ht1	282710771
bost-ht2	1184520
eqxch2-ht2	1809320
slac50s-ht1	8545951
salt-ht2	568492
lbnl59-ht2	882130013
newy1118th-ht2	1071826
elpa-ht2	480642
ornl5600-ht1	45841556
atla-ht2	772929
eqxsv5-ht1	2835203590
anl541b-ht2	924414
slac50n-ht1	2221787835
nash-ht2	696555
atla-ht1	108835837
bois-ht2	432433
anl541b-ht1	65303026
eqxsv5-ht2	1189111
ornl5600-ht2	721476
newy1118th-ht1	2991159948
sand-ht2	387820
bnl515b-ht2	829636

## Wireshark

tv-netflix-problems-2011-07-06.pcap

Apply a display filter: ...<Ctrl>/>

No.	Time	Source	Destination	Protocol	Length	Info
343	65.142415	192.168.0.21	174.129.249.228	TCP	66	40555 → 80 [ACK] S
344	65.142715	192.168.0.21	174.129.249.228	HTTP	253	GET /clients/netf1
345	65.230738	174.129.249.228	192.168.0.21	TCP	66	80 → 40555 [ACK] S
346	65.240742	174.129.249.228	192.168.0.21	HTTP	828	HTTP/1.1 302 Moved
347	65.241592	192.168.0.21	174.129.249.228	TCP	66	40555 → 80 [ACK] S
348	65.242532	192.168.0.21	192.168.0.1	DNS	77	Standard query res
349	65.276870	192.168.0.1	192.168.0.21	DNS	489	Standard query res
350	65.277992	192.168.0.21	63.80.242.48	TCP	74	37063 → 80 [SYN] S
351	65.297757	63.80.242.48	192.168.0.21	TCP	74	80 → 37063 [SYN, A
352	65.298396	192.168.0.21	63.80.242.48	TCP	66	37063 → 80 [ACK] S
353	65.298687	192.168.0.21	63.80.242.48	HTTP	153	GET /us/rnd/client
354	65.318730	63.80.242.48	192.168.0.21	TCP	66	80 → 37063 [ACK] S
355	65.321733	63.80.242.48	192.168.0.21	TCP	1514	[TCP segment of a

Frame 349: 489 bytes on wire (3912 bits), 489 bytes captured (3912 bits) on Ethernet II, Src: Globalsec\_00:3b:0a (f0:ad:4e:00:3b:0a), Dst: Vizio\_14:8a:e1 (00:19:f3:14:8a:e1), Src Port: 53, Dst Port: 53 (53), Dst Port: 34036 (34036)

Domain Name System (response)

request.in.ans

[Time: 0.034338000 seconds]

Transaction ID: 0x2188

Flags: 0x8180 Standard query response, No error

Questions: 1

Answer RRs: 4

Authority RRs: 9

Additional RRs: 9

Queries

- cdn-0.nflximg.com: type A, class IN

Answers

Authoritative nameservers

0020 00 15 00 35 84 f4 01 c7 83 5f 21 88 81 00 00 01 ...5... 21... 0030 00 04 00 09 05 05 03 64 6e 2d 30 07 0e 66 6c ...c... dn-0.nfl 0040 78 69 6d 67 03 63 6f 6d 00 01 00 01 c0 0c 00 ximg.com ..... 0050 05 00 01 00 00 05 29 00 22 05 69 6d 61 67 65 73 .....). images 0060 07 6e 65 74 66 6c 69 78 03 63 6f 6d 09 65 64 67 .netflix.com.edg 0070 65 73 75 69 74 65 03 6e 65 74 00 c0 2f 00 05 00 esuite.n et./...

Identification of transaction (dns.0), 2 bytes

## Grafana / Stardust

HT / Martians

Summary Information

Total Martian Packets	838,895	Total Martian Packets	1,002,676	IP's Sending Martians	470	Organization Senders	8	Type of Martians	6	Martian Packets Forwarded	0
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Senders of Martians

Flows	Packets	Unique Senders	Unique AS Destinations	Sender Org
414628	421280	206	414628	BNL-AS
280178	418749	124	280178	NERSC
122043	127846	44	122043	ESNET
15175	16044	1	15175	ESNETEAST
4719	5677	38	4719	SLAC
1917	1917	43	1917	Martian
146	11074	1	146	ESNETWEST
89	89	13	89	ORNL-MSRINET

Types of Martians

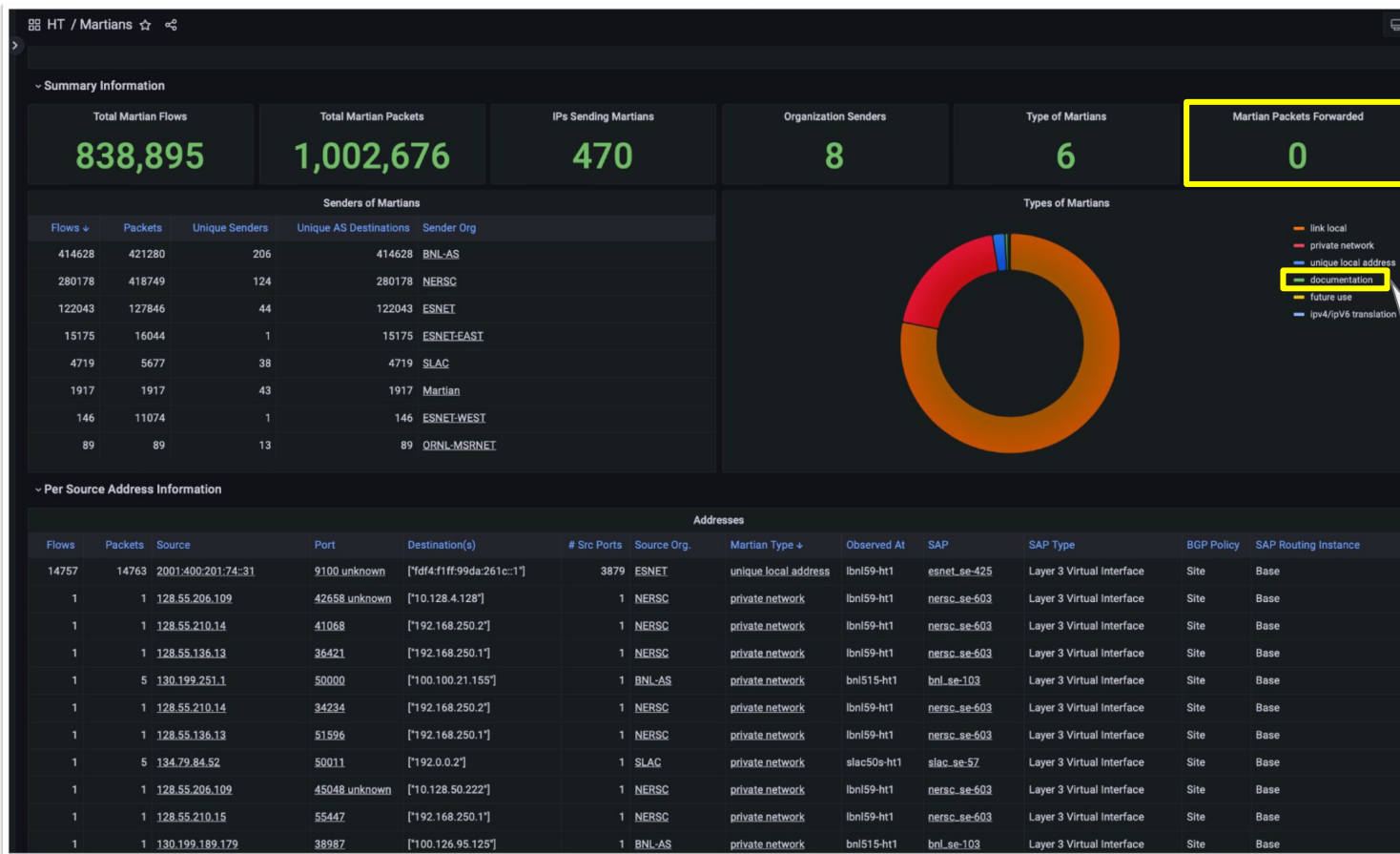
Per Source Address Information

Flows	Packets	Source	Port	Destination(s)	# Src Ports	Source Org	Martian Type	Observed At	SAP	SAP Type	Layer 3 Virtual Interface	SAP Policy	SAP Routing Instance
14787	14763	2001-400-201-24-31	9100	unknown	[*64-F11F-96aa261c*]	3879	ESNET	unique.local.address	bnl59-H1	enst-4e-525	Layer 3 Virtual Interface	Site	Base
1	1	128.55.206.109	42658	unknown	[*10.128.4.128*]	1	NERSC	private.network	bnl59-H1	nersc-4e-503	Layer 3 Virtual Interface	Site	Base





# Network Audits - Martians



Bogon filtering at work!

Why do we have "documentation" (e.g., TEST-NET) addresses?

- **SONIC** - Open Source Switches
- **Docker** - Data Center Auto Config





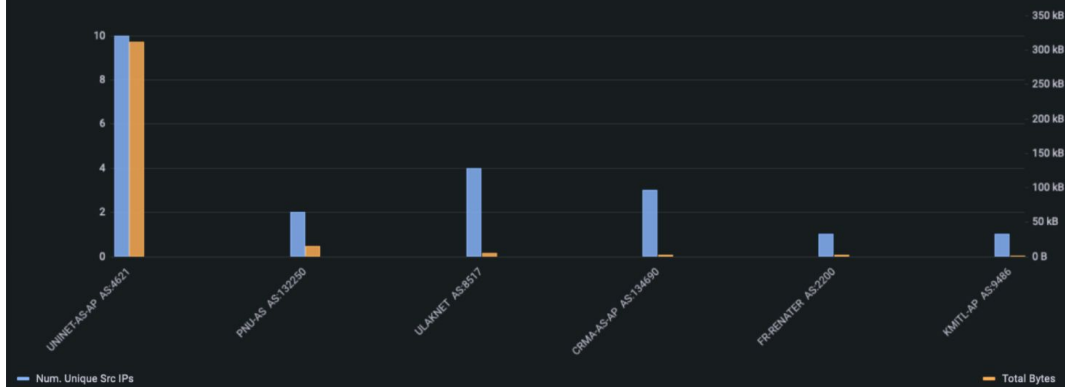
# LHCONE Traffic - CRIC Audit



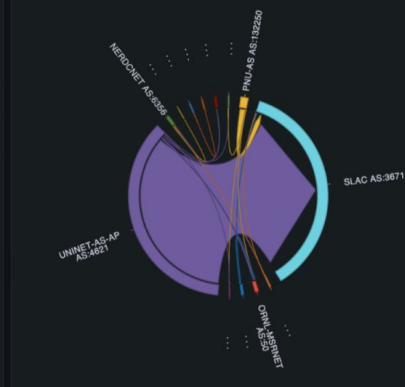
## Undocumented Sources to Documented Destinations

LHC One Undocumented Sources									
Num. Flows	Total Bytes	Router	Interface	Src AS1	Src Org.	Dst IP	Dst AS1	Dst Org.	
39	1.56 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.24.197	3671	SLAC	
38	1.52 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.110.7	3671	SLAC	
38	1.52 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.60.133	3671	SLAC	
38	1.52 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.244.2	3671	SLAC	
38	1.56 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.188.23	3671	SLAC	
37	1.48 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.22.48	3671	SLAC	
36	1.44 kB	atla-cr6	1/1/c3/1	4621	UNINET-AS-AP	128.227.246.204	6356	NERDCNET	
36	1.44 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.140.185	3671	SLAC	
36	1.48 kB	slac50s-cr6	1/1/c2/1	4621	UNINET-AS-AP	134.79.14.233	3671	SLAC	

Unique Undocumented Senders and Traffic Moved By Organization



Top Talkers by Count of Flows



WLCG CRIC Database for LHCONE prefixes (wlcg-cric.cern.ch)

JSON Query

ESnet High-Touch Data lake

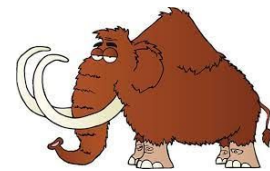
SQL Query Select \* NOT in JSON

[]

Should be empty set



# Network Planning - Flow Volumes



SELECT \* WHERE peak\_rate > 10gbps AND duration > 10secs ORDER BY rate

caida_org_name_src	caida_org_name_dst	ip_src	ip_dst	Gbps	hostname_src	hostname_dst
U-CHICAGO-AS	ARGONNE-AS	192.170.224.134	140.221.68.2	30.037561	scidmz-ps4.scidmz.uchicago.net	typhoon.pub.alcf.anl.gov
ARGONNE-AS	U-CHICAGO-AS	140.221.68.2	192.170.224.134	27.532194	typhoon.pub.alcf.anl.gov	scidmz-ps4.scidmz.uchicago.net
ESNET	ESNET	2001:400:f010:200::1	2001:400:f010:240::1	26.215328	eqxch2-ps-tp.lhcone.es.net	fnalfcc-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:ee00:20::1	2001:400:ee00:21::1	26.209250	lbn159-ps-tp.es.net	lbn150-ps-tp.es.net
ESNET	ESNET	2001:400:f010:640::1	2001:400:f010:641::1	26.208939	bn1515-ps-tp.lhcone.es.net	bn1515b-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:ee00:880::1	2001:400:ee00:881::1	26.208344	orn1064-ps-tp.es.net	orn15600-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:221::1	2001:400:ee00:220::1	26.208284	anl1541b-ps-tp.es.net	anl221-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:881::1	2001:400:ee00:880::1	26.207954	orn15600-ps-tp.es.net	orn1064-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:601::1	2001:400:ee00:600::1	26.207889	newy1118th-ps-tp.es.net	newy32a0a-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:881::1	2001:400:ee00:882::1	26.207831	orn15600-ps-tp.es.net	orau-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:200::1	2001:400:ee00:201::1	26.206976	eqxch2-ps-tp.es.net	chic-ps-tp.es.net
ESNET	ESNET	2001:400:f010:200::1	2001:400:f010:221::1	26.206912	eqxch2-ps-tp.lhcone.es.net	an1541b-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:ee00:200::1	2001:400:ee00:202::1	26.206903	eqxch2-ps-tp.es.net	star-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:882::1	2001:400:ee00:881::1	26.206468	orau-ps-tp.es.net	orn15600-ps-tp.es.net
ESNET	ESNET	2001:400:f010:240::1	2001:400:f010:221::1	26.206126	fnalfcc-ps-tp.lhcone.es.net	an1541b-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:ee00:200::1	2001:400:ee00:221::1	26.205755	fnalfcc-ps-tp.es.net	anl221-ps-tp.es.net
ESNET	ESNET	2001:400:ee00:240::1	2001:400:ee00:221::1	26.205489	eqxch2-ps-tp.es.net	an1541b-ps-tp.es.net
ESNET	ESNET	2001:400:f010:221::1	2001:400:f010:220::1	26.204826	an1541b-ps-tp.lhcone.es.net	anl221-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:f010:200::1	2001:400:f010:220::1	26.204472	eqxch2-ps-tp.lhcone.es.net	anl221-ps-tp.lhcone.es.net
ESNET	ESNET	2001:400:ee00:220::1	2001:400:ee00:200::1	26.203990	anl221-ps-tp.es.net	eqxch2-ps-tp.es.net
ESNET	ESNET	2001:400:f010:241::1	2001:400:f010:200::1	26.203445	fnalfcc-ps-tp.lhcone.es.net	eqxch2-ps-tp.lhcone.es.net

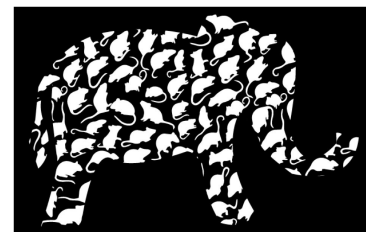
Primarily perfSONAR transfers

## Observation

- **perf5ONAR** traffic appears to be the primary contributor of “large” flows in this dataset.

## Supposition\*

- Large data movement tools (e.g., Globus, etc) utilize massively parallel small flows to reduce the impact of packet loss.

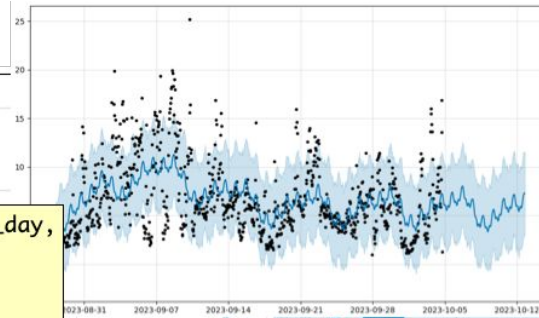




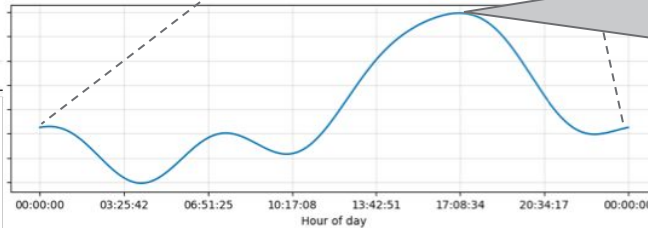
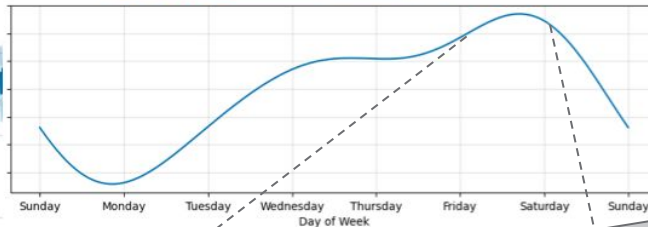
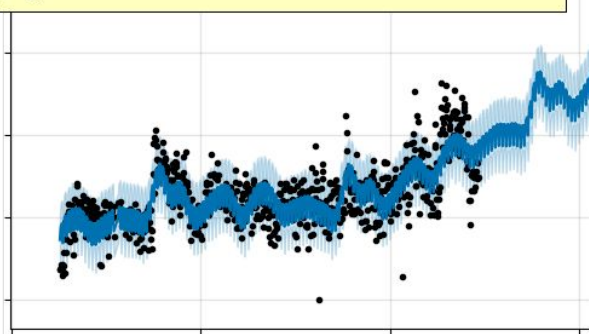
# Trend Analysis / (Peak) Capacity Planning



```
SELECT HISTOGRAM(start, INTERVAL 1 DAY) as by_day,  
       sum(values.num_bits)/8 as total_bytes  
FROM stardust_hightouch-  
WHERE router_name = 'atla-cr6'  
GROUP BY 1  
ORDER BY 1
```

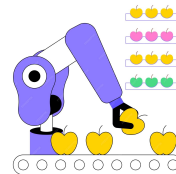


- High-Touch data is exported into existing measurement systems (i.e., Stardust), allow us to leverage existing analysis, but with much higher fidelity

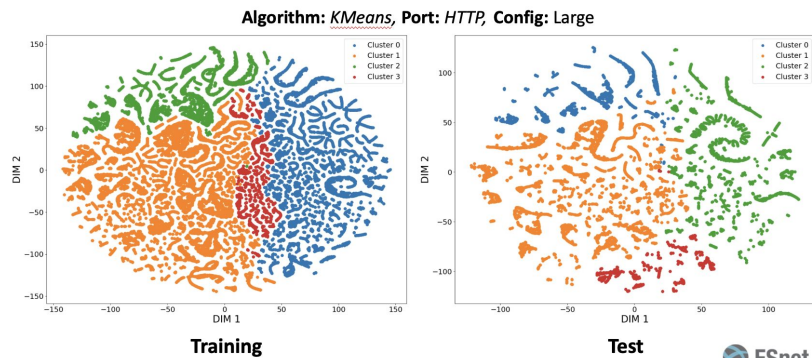


Analysis (for a single router, **atla-cr6**) using hourly aggregates, shows that 17:00 UTC and Fridays are peak demand times.

# ML - Clustering / Self Similarity / Prediction



## Cluster Visualization

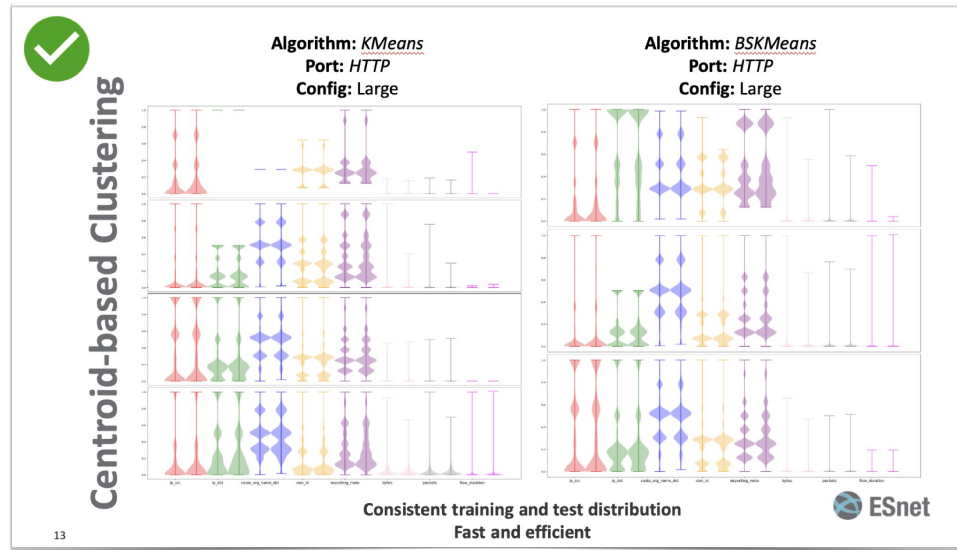


## Observation

- We are seeing consistent auto clustering over the 24-hr (12 billion) flow data set.

## Implications

- We can do capacity planning and prediction without worrying about wild fluctuations.
- We can automate exception/anomaly detection.



# Summary

## 1. What problem are we solving?

Gaining a complete understanding of high-speed network traffic, leading to improved performance and reliability for science workflows.

## 2. How is what we are doing different from what is done today?

A combination of programmable hardware and software enables custom collection and analysis.

## 3. How does this benefit the user community?

It helps network and security engineers troubleshoot issues and investigate anomalies, resulting in improved service.

## 4. How can the user community get involved?

Send email to: [hightouch@es.net](mailto:hightouch@es.net)

Questions...

