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#### Infrastructure and Analytics Summary (Tier–1)

Fernando Fernandez Galindo TRIUMF Scientific Computing Department

US ATLAS Computing Facilities Face-to-Face at SLAC December 1st, 2022



1

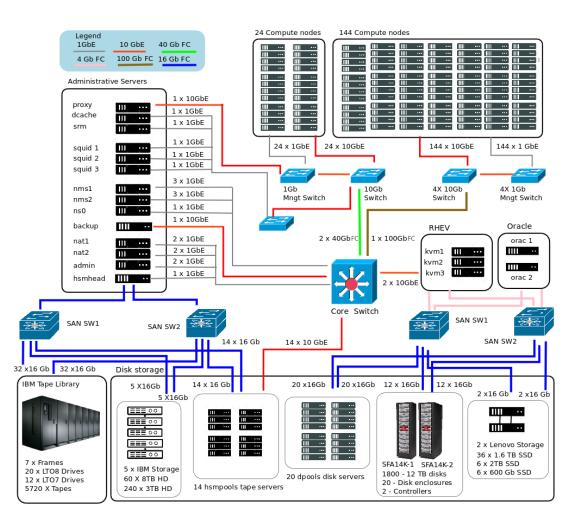
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# INFRASTRUCTURE SUMMARY

#### • Compute:

- ARC CE 6.15.1
- HTCondor 9.0.11
- 1,600 cores at TRIUMF.
- 7,820 at Simon Fraser University.
- Storage:
  - dCache (6.2.39 -> 7.2.26 soon)
    - 30 dpool serving 17PB of usable disk.
    - 13 hsmpool nodes 36PB of usable tape.
- OS:
  - Mostly running on SL 7.9
  - RedHat has given us 1,000 licenses of RHEL 9 to which we will be upgrading to in the near future.





# ANALYTICS PROJECT MOTIVATION

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CPUs

User

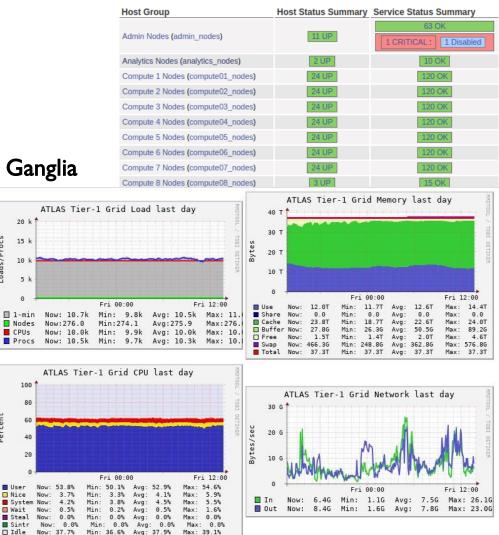
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Wait

Steal

- With growing infrastructure an ever-increasing collection of heterogeneous monitoring data is produced.
- Our existing monitoring and alerting implementation is • robust and stable but rather static and isolated.
- Early 2020 we started the analytics project on • hardware that was deprecated.
- The project's main objectives are:
  - Create a framework where the different datasets can be brought in together for analysis and monitoring.
  - Experiment with tools and techniques like ML, to assist in finding correlations between different areas of our infrastructure, detect anomalies, inefficiencies and maybe even predict issues.

#### Nagios





# NEW HARDWARE (FALL 2022)

#### Frontend (Elasticsearch and clients)

- 1x PowerEdge R650
- CPU:

2x Xeon 6336Y – 24 cores with Scikit-learn extensions.

- GPU: Nvidia Telsa T4
- Memory: 256GB
- Network: Nvidia Mellanox ConnectX-5
- Storage: 2x 480GB SSD (OS) 2x 3.84TB NVMe

#### Backend (Elasticsearch and Logstash)

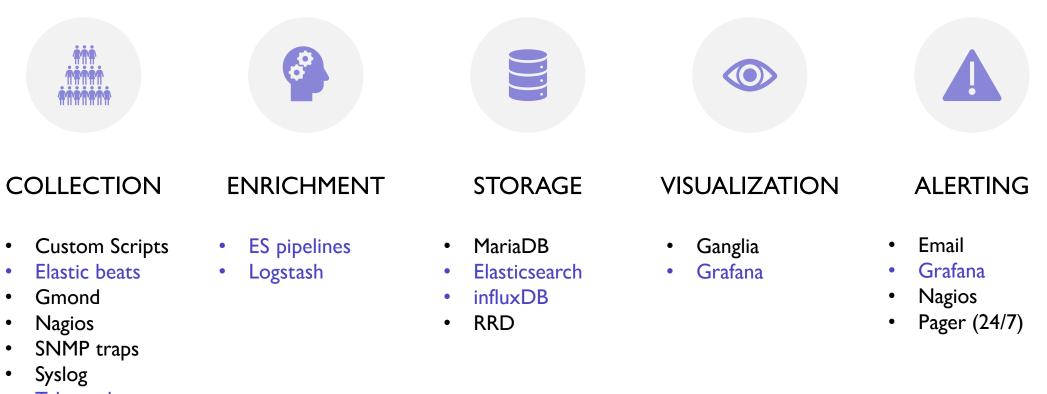
- 2x PowerEdge R650
- CPU: Xeon 6326 – 16 Cores
- Memory: 256GB



- Network: Nvidia Mellanox ConnectX-5
- Storage: 2x 480GB SSD (OS)
  2x 3.84TB NVMe (Hot Data)
  2x 7.68TB SSD (Warm Data)
- KVM will be used to create 4 ES nodes: master, hot data, warm data, transform (with logstash).



#### SOFTWARE OVERVIEW





### ELASTIC SUITE

- It is the workhorse of the analytics platform.
- Originally interested in their built-in machine learning tools and while promising, licensing is expensive. The free 'basic' license provides all our needs so far.
- Currently using version 7.17.6, upgrading to 8.3.3 soon.
- Elasticsearch:
  - Flexible database, can hold heterogeneous data.
  - Easy to grow horizontally as demands increase.
  - Many tools to aggregate and transform data.
- Logstash:
  - Many filters to parse and enrich data.
  - Multiple instances and pipelines to balance the load.
  - Many input and output protocols.
  - Persistent and 'dead-letter' queues.
- Beats:
  - 'Smart' collectors that monitor log files (Filebeat), service metrics (Metricbeat) and network ports (Packetbeat).
  - Balance loads to multiple outputs and queues data if they are unavaliable.





### GRAFANA

- Currently using version 9.2.1
- Our main visualization software for the following reasons:
  - It can use a large variety of different data sources.
  - Has many options for creating nice looking dashboards easily.
  - Powerful templating of panels.
  - It can further transform data on the fly.
  - It can generate alerts data query-based alerts.





Da	ta Acquisition	Legend					
	Clients	Research Network	ES Transport network				
Kiban	a Grafana Scripts		CLINDS, DORBALLE MARTINE				
	ES Masters	Dat	a Collection				
Hosts: analytics (voting-only) es-main01 es-main02 Description: No data storage.	2 are required online to reach 'quorum', the cluster goes red and stops receiving data to avoid split- brain. Receive and coordinate data queries.	D Filebeat	<b>ata Shippers</b> Metricbeat Scripts				
These manage and coordir Elasticsearch cluster.		Data	Mar ipulation				
	+	Data Inno	tion and Transforme				
		Hosts:	stion and Transforms and uses Logstash and				
[	Data Storage	es-tr01 es-tr02	Elasticsearch Ingest pipelines to extract and enrich raw logs and metrics.				
	Hot Data		tored, Elasticsearch Transforms are				
Hosts: es-data-hot01 es-data-hot02	Stores new raw and aggregated data.	only queues. Receive data from colle	used to create data aggregations and ectors summmaries.				
Description: Fast NVMe drives.	Main source for 'real-time' data.		Analytics				
T asc invine unives.		Hosts:	//maijiloo				
	Warm Data	analytics ahw-gpu					
Hosts: es-data-warm01 es-data-warm02	Stores data that is considered 'historical'.	Description: Scripts that use data sto order to create statistica					
Description: SSD drives.	Source/backup for data that cannot be re-created.	models.					

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Logs

Service	Size (GB)	Storage DB
dCache (billing, ftp srm webdav xrootd access)	4,500	Elasticsearch
network (router)	2	Elasticsearch
SNMP (traps)	15	MariaDB
system (auth, iptables, kernel)	400	Elasticsearch

#### \* 2GB for all datasets in RRD

DATASETS

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#### **Metrics**

Service	Size (GB)	Storage				
dCache (queues, movers)	25	Elasticsearch				
dCache (netflows)	1,250	Elasticsearch				
HTCondor (job history, status)	10	Elasticsearch				
infrastructure (DDN and inlet temps, SSD TBW)	50	Elasticsearch				
infrastructure (humidity, PDU, temps, etc)	2*	RRD				
mySQL (status)	1	Elasticsearch				
network (router sflow)	15	influxDB				
postgreSQL (activity, bgwriter, database)	200	Elasticsearch				
system (cpu, mem, net, etc)	2*	RRD				
tape library stats (device, volume)	2	influxDB				
tape library (consumption, performance, staging, etc)	2*	RRD				

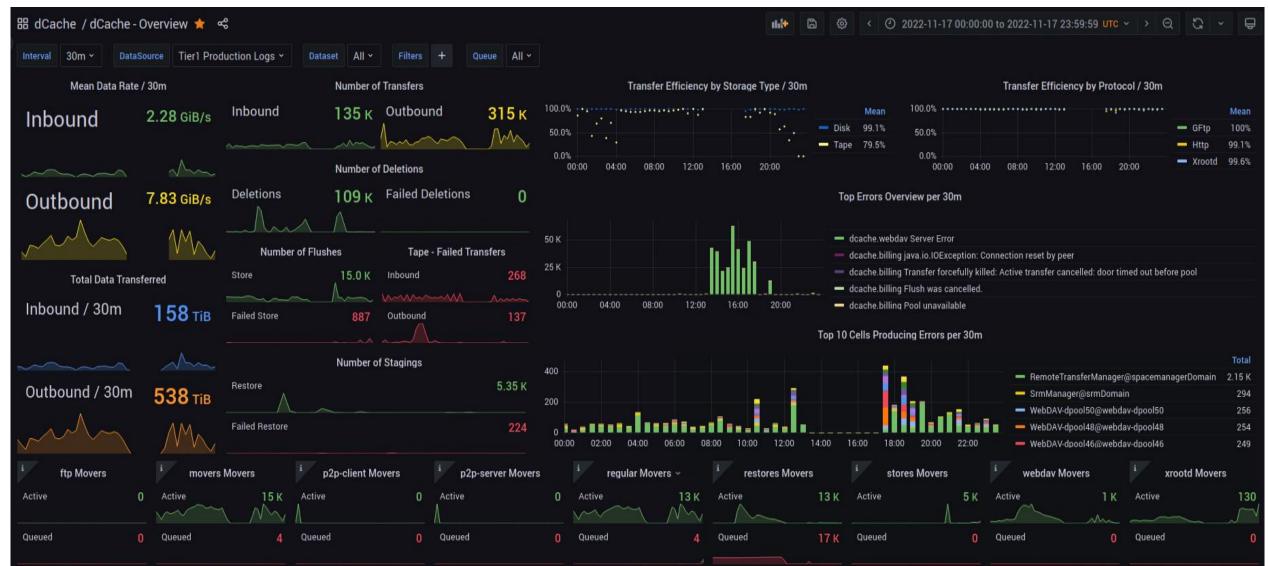
### DCACHE

- Filebeat monitors and ships the contents of dCache's logs.
  - Billing logs contain transaction information within the scope of dCache.
  - Access logs contain transaction information pertaining to the different door protocols (FTP, SRM, WebDAV, XRootD).
- Logstash parses these logs into fields to create Elasticsearch documents, and enrich them as necessary (DNS resolution, GeoIP, tags).
- Packetbeat monitors the door protocol ports to obtain network flows and TLS handshake response times.
- A custom script parses dCache's pool queue table and sends it to Elasticsearch.





## DCACHE OVERVIEW DASHBOARD





## TAPE LIBRARY (HSM)

- The library produces SNMP traps when there are failures which are stored in MariaDB instance from where Grafana queries the information directly.
- Another MariaDB instance that records the tape library's devices and volumes activities.
- A custom script extracts the data and sends it to influxDB where we can manipulate it for later visualization.
- Here we chose influxDB to test and see how it compares against Elasticsearch for metrics data. Main benefit so far is the smaller storage footprint. Still investigating if there are other benefits.







### TAPE LIBRARY DASHBOARD

~ Overview							
Completed	Bytes Writt		Busiest Drives Failed Actions by Drive				Total Device Actions. Dev: All
		devname 🏷	actions ᡪ	7 devname 🖓	failures 🖓		10.0 K Total
131.46 к	1.63 тів	<u>changer1</u>	3058	4 <u>LTO8F6C4R3</u>	10514	e	1.0K — F 10.5K
		LTO8F2C3R3	2380	2 <u>LTO8F6C2R3</u>		Log Scale	
Failed Acti	Bytes Read	LTO8F6C4R3	2139	4		Γc	100.0
Tulled Acti	Dytes Redu	LTO8F6C2R3	911	6			10.0 00:00 03:00 06:00 09:00 12:00 15:00 18:00 21:00
10.52 к	2.26 ТіВ						
TU.52 K	2.20 118	В	usiest Volumes	Failed Actio	ons by Volume		All traps
		volume 🐬	actions §	7 volume 🖓	failures 🖓		12.5 Total
0	14/ T	<u>S02428L8</u>	2283	6 <u>S01235L8</u>	10512		10.0 CRITICAL 4
Critical Tra	Warning Tr	<u>S01235L8</u>	2137	8 <u>S02296L8</u>		Traps	warning 8
			2137			Tra	7.5
Δ	2	<u>S02081L8</u>	902	8 <u>S02081L8</u>			5.0
	U	<u>S01887L8</u>	896	4			00:00 03:00 06:00 09:00 12:00 15:00 18:00 21:00
				SNM	P trap description		
Time	Hosts 🖓	7 Total traps	Severity 🐬 🛛 Trap m	essage			
2022-11-24 10:42	:30 ts4500-lcd	c1 2	WARNING Trap	for drive TapeAlert (	003. Flag: Hard erro	or. Ty	Type: W Cause: The drive had an unrecoverable read, write, or positioni
2022-11-24 10:42	:31 ts4500-lco	2 2	WARNING Trap	for drive TapeAlert (	003. Flag: Hard erro	or. Ty	Type: W Cause: The drive had an unrecoverable read, write, or positionj
2022-11-24 10:42	:32 ts4500-lco	c1 1	CRITICAL Trap	for drive TapeAlert (	005. Flag: Read fail	lure.	e. Type: C Cause: The drive can not determine if an unrecoverable read 1
2022-11-24 10:42	:33 ts4500-lco	c1 2	CRITICAL Trap	for drive TapeAlert (	005. Flag: Read fail	lure.	e. Type: C Cause: The drive can not determine if an unrecoverable read 1
2022-11-24 10:42	:33 ts4500-lco	2 1	CRITICAL Trap	for drive TapeAlert (	005. Flag: Read fail	lure.	e. Type: C Cause: The drive can not determine if an unrecoverable read 1
2022-11-24 10:42	:34 ts4500-lco	2 2	CRITICAL Trap	for drive TapeAlert (	005. Flag: Read fail	lure.	e. Type: C Cause: The drive can not determine if an unrecoverable read 1

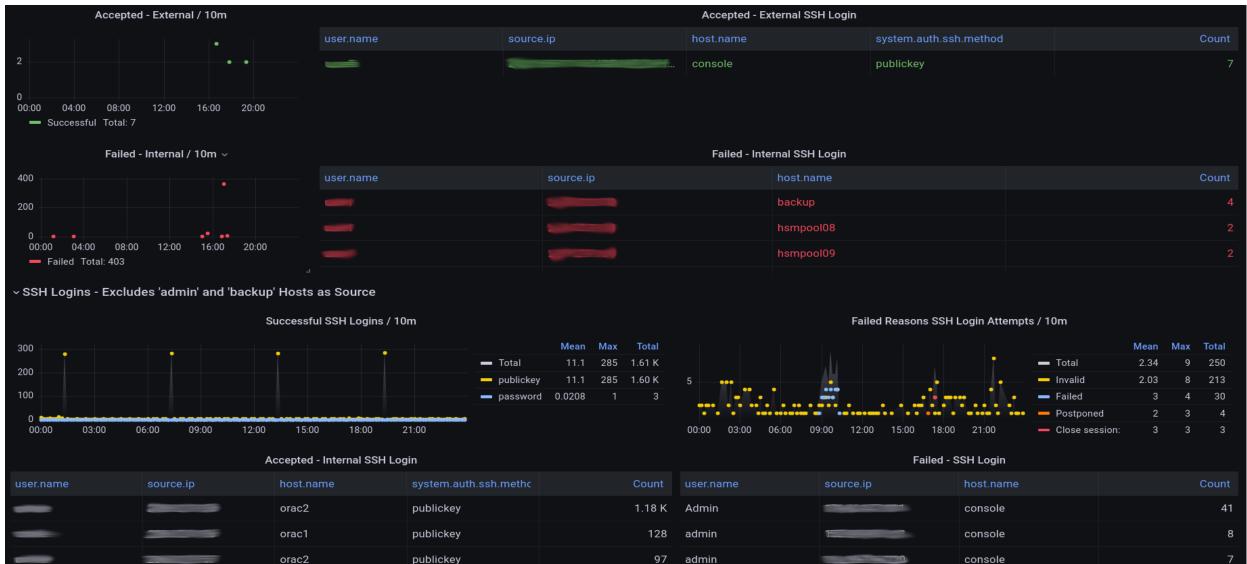


### SYSTEM SYSLOG

- All our hosts' kernel, auth and iptables logs are sent centralized via Syslog to one location and file.
- Filebeat monitors and ships the data.
- Logstash separates the three datasets, parsing and enriching as necessary.
- Our goal is to monitor and detect hardware issues, unauthorized logins and network traffic rejections.
- This is one of the datasets we would like to apply machine learning anomaly detection.



### LOGINS OVERVIEW DASHBOARD





# CURRENT AND FUTURE WORK

- Migrating Elasticsearch to the new hardware.
- Cleanup of existing datasets and re-processing in some instances.
- Creating 'events' database for overlay on Grafana and classification.
- Creating of time aggregated datasets (e.g. 1hour bins) to both reduce storage usage and normalization.
- Creating Grafana alerts from existing dashboards.
- "Tokenizing" logs. (e.g. 1.1.1.1 -> <IPADDRESS>).
- Creating tools for testing and implementing machine learning tools like anomaly detection, classification, correlation, prediction.
- Identification of datasets that can be brought together to create "vectors" for correlation analysis.
- Investigate the use of GPUs for this type of work.





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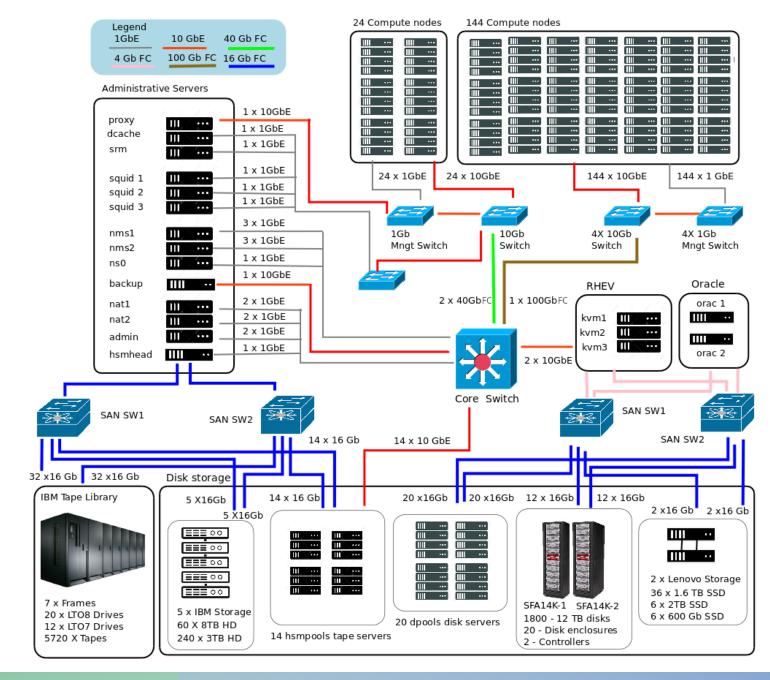


17

# ADDITIONAL MATERIAL



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### CORE ROUTER SFLOW

- Telegraf receives sflow data from our Juniper core router. Only a percentage sample of all data is captured due to its large magnitude.
- Data is stored on influxDB.
- One idea is to implement Snort/Suricata as an intrusion detection system.
- Logs would be sent to Elasticsearch







# WORKER NODES INLET TEMPS

- A custom script queries all worker nodes' iDrac interfaces to obtain current temperature.
- It writes all information to a logfiles.
- Filebeat monitors and ships the data.
- Logstash parses these logs into fields to create Elasticsearch documents, enriching it with infrastructure data.

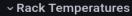




### WORKER NODES INLET TEMPS

#### Overview

								Ma	ax Devic	e Inlet Te	emperat	ure Hist	ory - Per	Rack / 1	lh ∽								
2 29	28	28	29	29	29	28	28	28	28	29	29	29	29	28	29	28	29	29	29	28	29	29	29
6 26	25	25	25	25	25	25	25	26	25	25	26	25	25	25	25	26	26	26	26	26	26	26	26
7 29	28	28	28	29	29	28	29	28	28	28	28	28	29	29	29	29	29	29	29	29	29	29	29
8 28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28	28
22:00	23:00	00:00	01:00	02:00	03:00	04:00	05:00	06:00	07:00	08:00	09:00	10:00	11:00	12:00	13:00	14:00	15:00	16:00	17:00	18:00	19:00	20:00	21:00
										Average	Inlet Ter	nperatu	re / 10m										
Mean Last * Max Min																							
28 °C																	- wns009	90-drac.d	evices.t1	28.1	°C 29	°C 29 °	C 28 °C
26 °C _																	wns00	92-drac.d	evices.t1	28.1	°C 29	°C 29 °	C 28°C
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24 °C							******			********			*********				wns009	91-drac.d	evices.t1	28.1	°C 29	°C 29 °	C 28 °C
22 °C		****														_	wns00	13-drac.d	evices.t1	28	°C 28	°C 29°	C 27 °C
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22:00	) 00	00:00	02:00	04:00	06	00	08:00	10:00	12	:00	14:00	16:00	18	:00	20:00								







Fernando Fernandez Galindo TRIUMF Scientific Computing Department US ATLAS Computing Facilities Face-to-Face at SLAC 2022-12-01 erage Max Temperature for i...

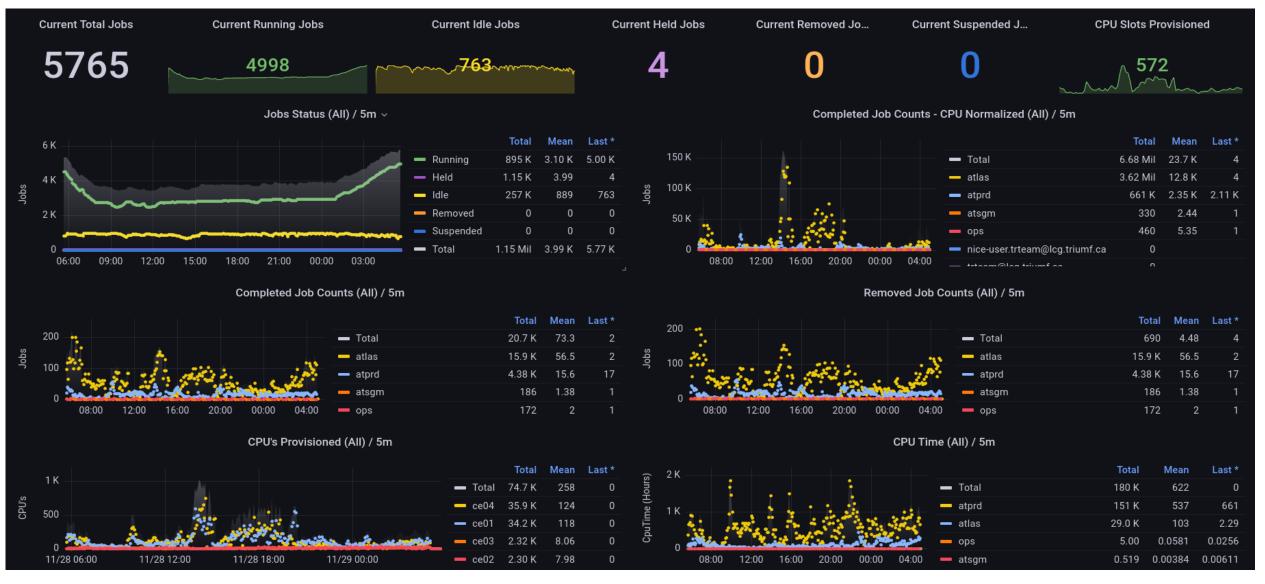
### HTCONDOR

- Two custom scripts query the HTCondor:
  - Every 15 minutes to obtain current jobs status.
  - Every 1 hour to obtain job history.
- Both write all information to two different logfiles.
- Filebeat monitors and ships the data.
- Logstash parses these logs into fields to create Elasticsearch documents.





# HTCONDOR JOBS' STATUS

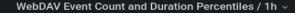


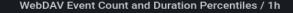


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#### DCACHE PROTOCOLS (PACKETBEAT)

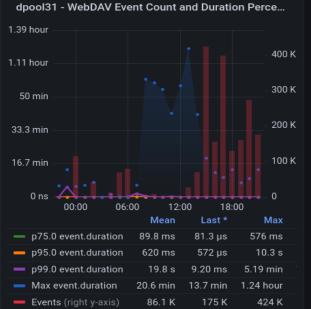
#### Packetbeat Flow - Event Count and Duration Percentiles by Protocol - Plots

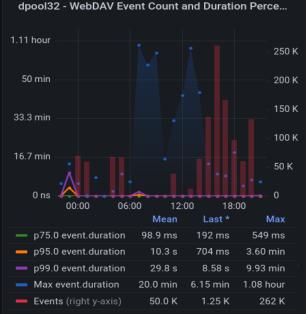


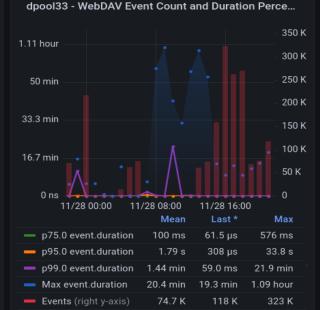


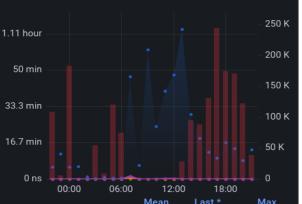


Packetbeat Flow - Event Count and Duration Percentiles by Host - Plots









dpool34 - WebDAV Event Count and Duration Perce...

	00:00	06:00	12	:00 18	:00
			Mean	Last *	Max
-	p75.0 event.durat	ion 8	89.0 ms	69.8 µs	512 ms
-	p95.0 event.durat	ion	1.36 s	4.23 ms	28.4 s
-	p99.0 event.durat	ion	5.24 s	192 ms	1.35 min
	Max event.duratio	on 1	8.0 min	13.4 min	1.15 hour
_	Events (right y-ax	is)	66.4 K	38.6 K	244 K



Min

181