

Jobstats: A Slurm-Compatible Job Monitoring Platform for CPU and GPU Clusters

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<https://tinyurl.com/8ar52z65>

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Motivation

Job monitoring is important for

- evaluating hardware performance
- identifying underperforming jobs
- troubleshooting failed jobs and more

About Princeton Research Computing

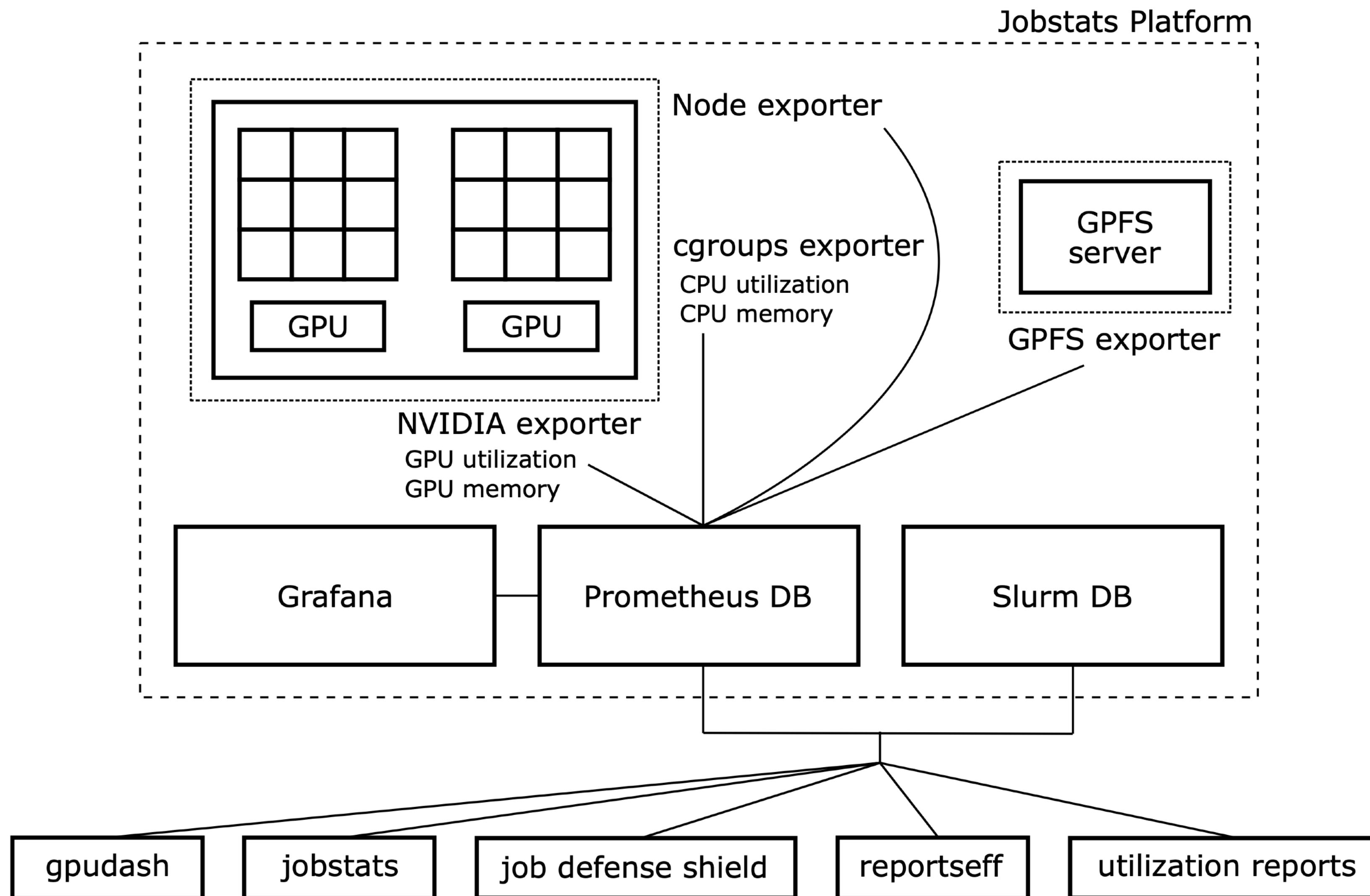
- 4 large clusters (100,000 CPU-cores, 500+ GPUs)
- 2000 active users per year
- Slurm workload manager

What We Were Missing

- Did not have a tool to monitor GPU jobs
- CPU memory usage for multi-node jobs was inaccurate
- Efficiency reports (seff) lacked detailed information
- Users had limited options when troubleshooting failed jobs

Existing job monitoring platforms

- Ganglia
- XDMoD
- TACC Stats
- MAP
- LIKWID
- PIKA



Four exporters make the job statistics available to the Prometheus database

Metrics

The following **job-level** metrics are available in both Grafana and the jobstats command

- CPU Utilization
- CPU Memory Utilization
- GPU Utilization
- GPU Memory Utilization

The following **job-level** metrics are exposed only in Grafana:

- GPU Temperature
- GPU Power Usage

The following **node-level** metrics are exposed only in Grafana:

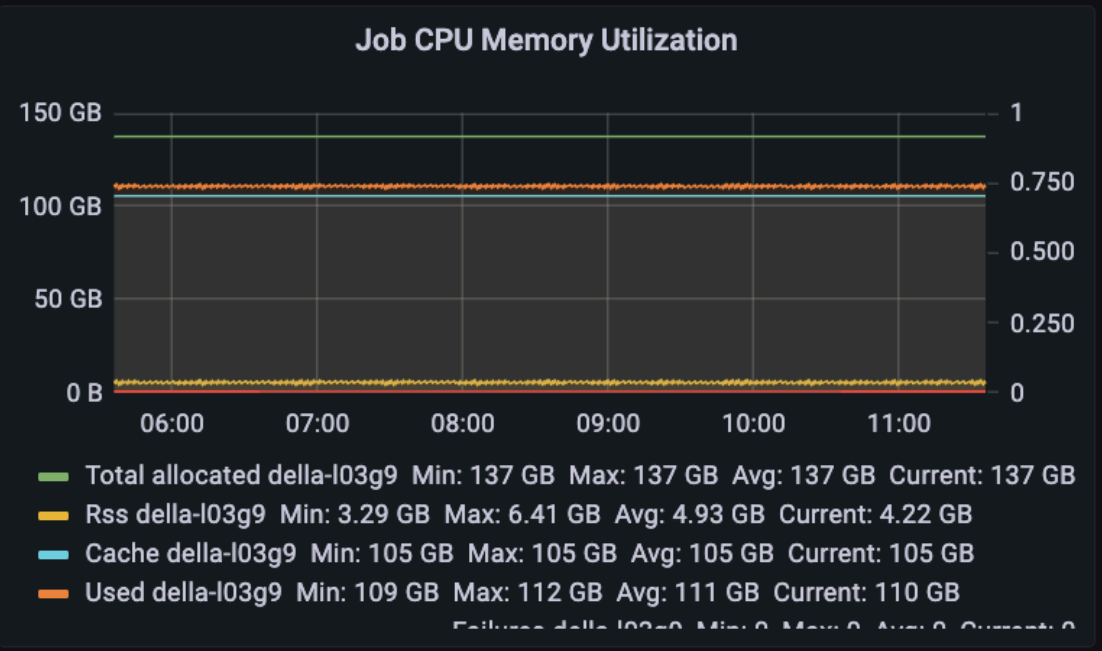
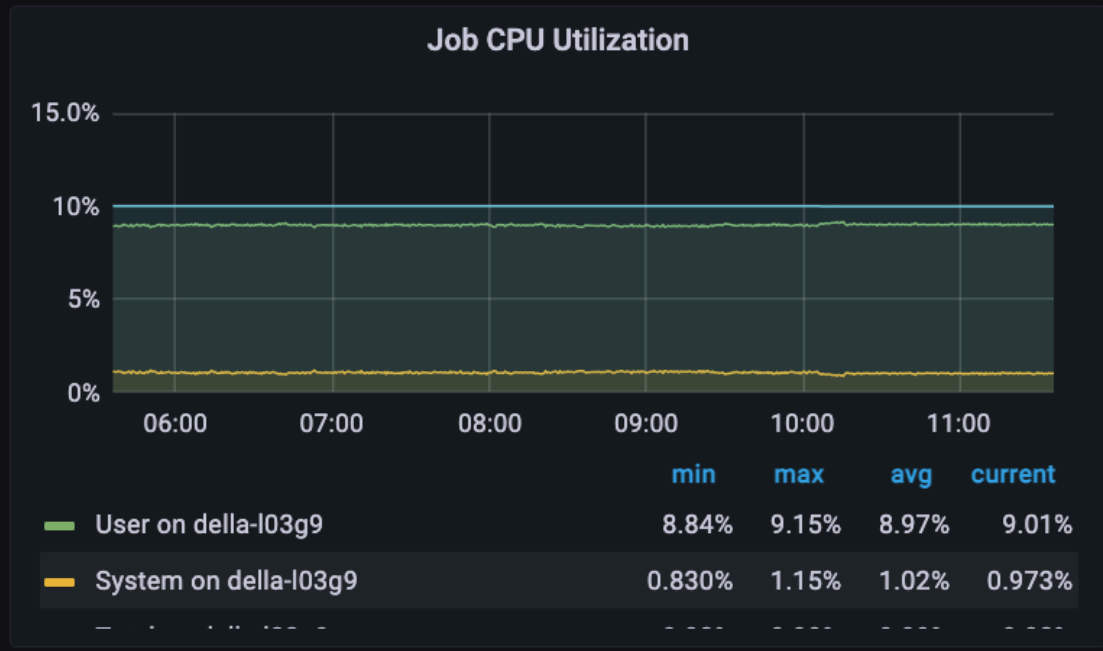
- CPU Percentage Utilization
- Total Memory Utilization
- Average CPU Frequency Over All CPUs
- NFS Statistics
- Local Disc R/W
- GPFS Bandwidth Statistics
- Local Disc IOPS
- GPFS Operations per Second Statistics
- InfiniBand Throughput
- InfiniBand Packet Rate
- InfiniBand Errors

<https://github.com/PrincetonUniversity/jobstats#grafana>

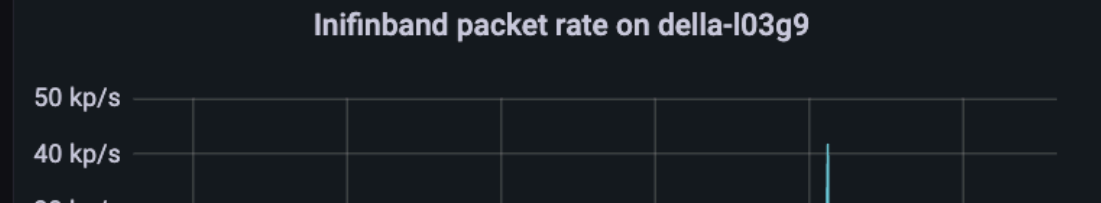
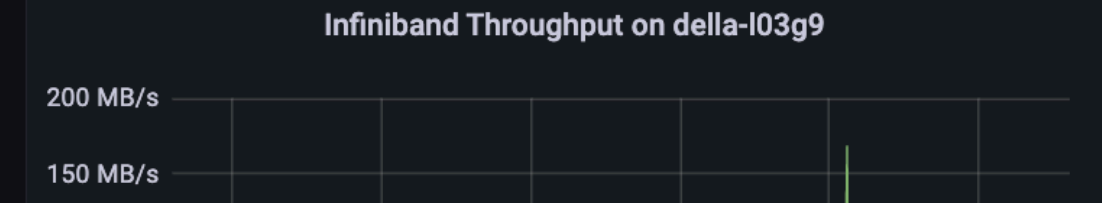
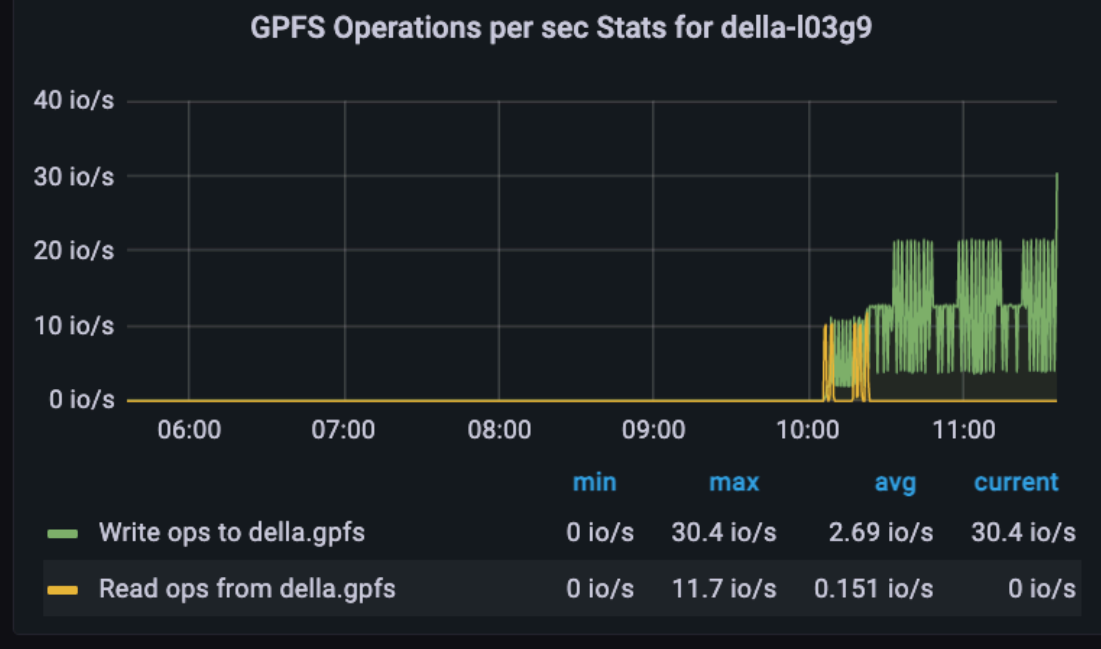
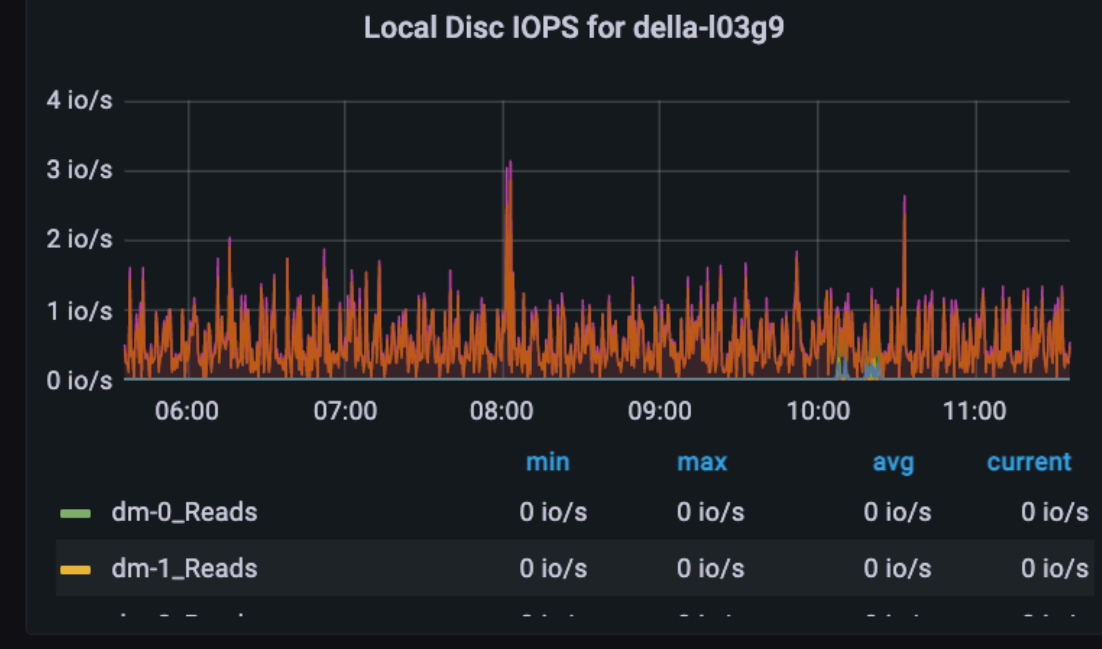
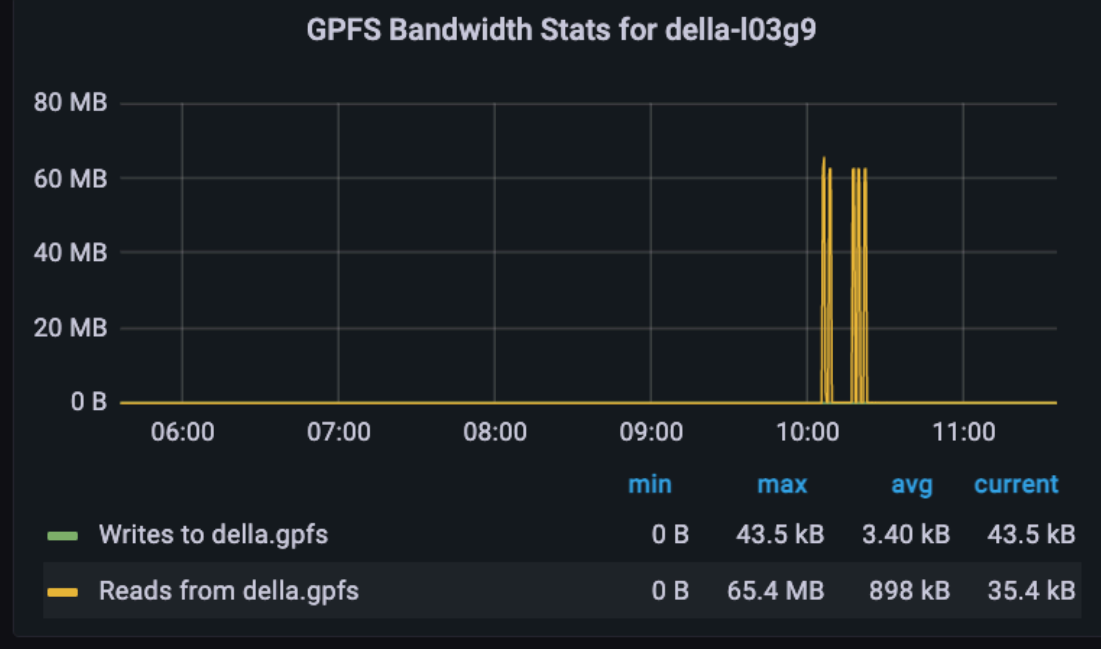
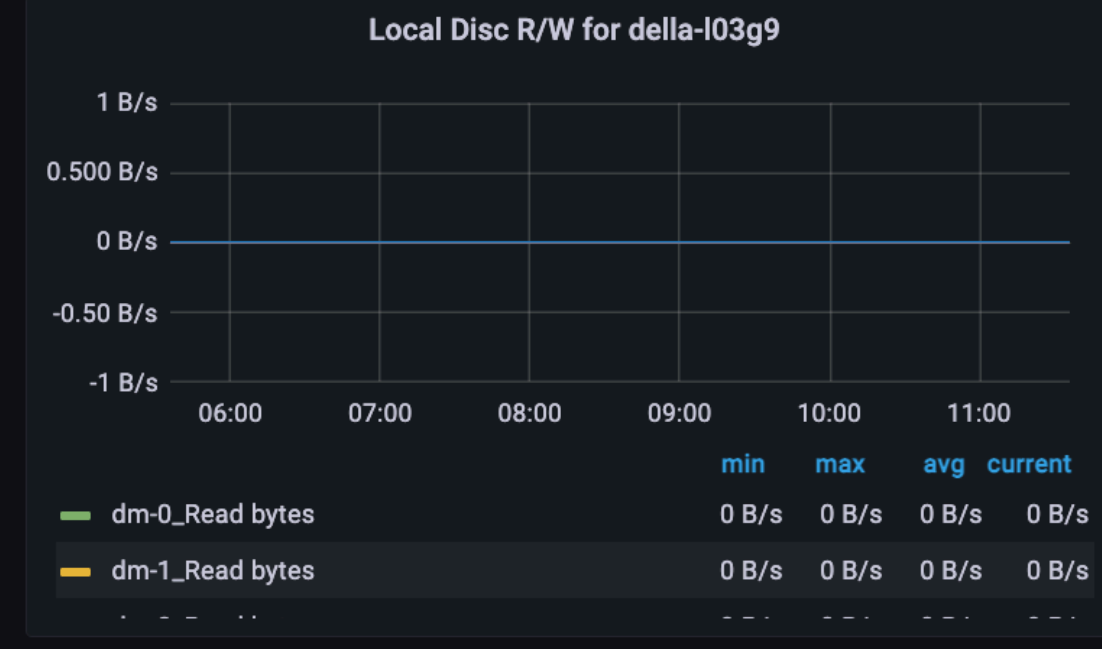
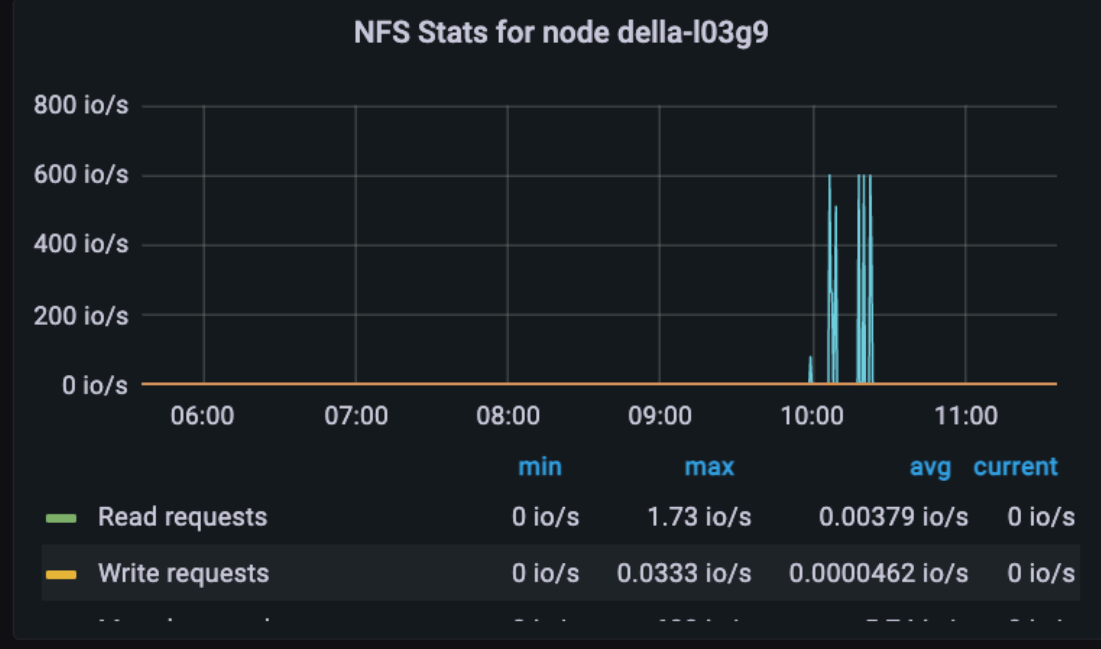
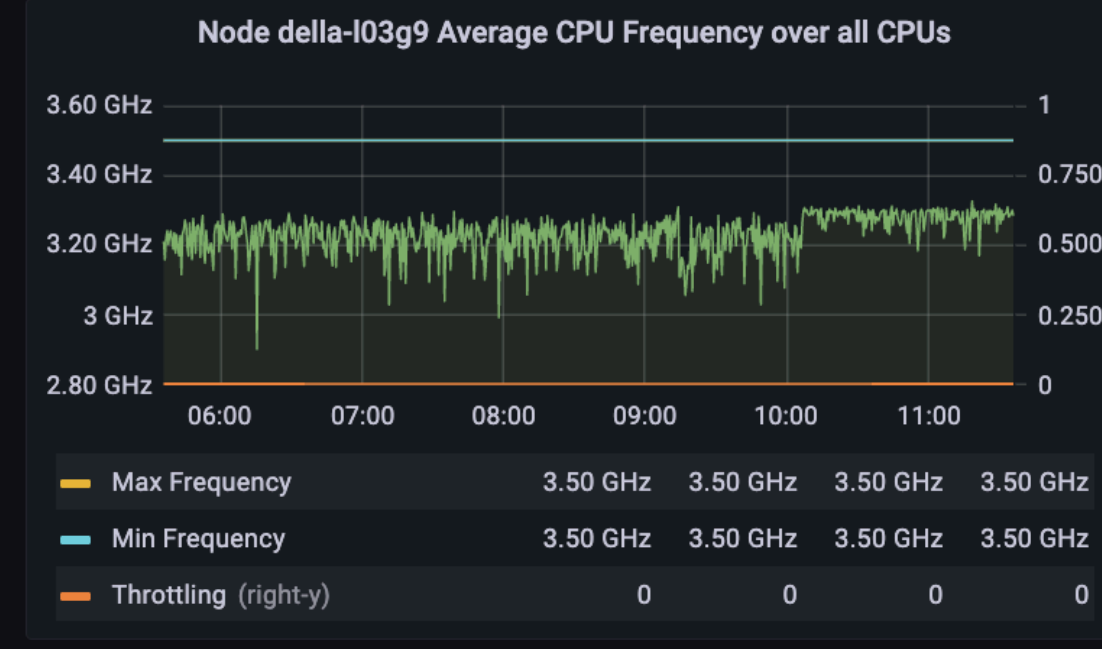
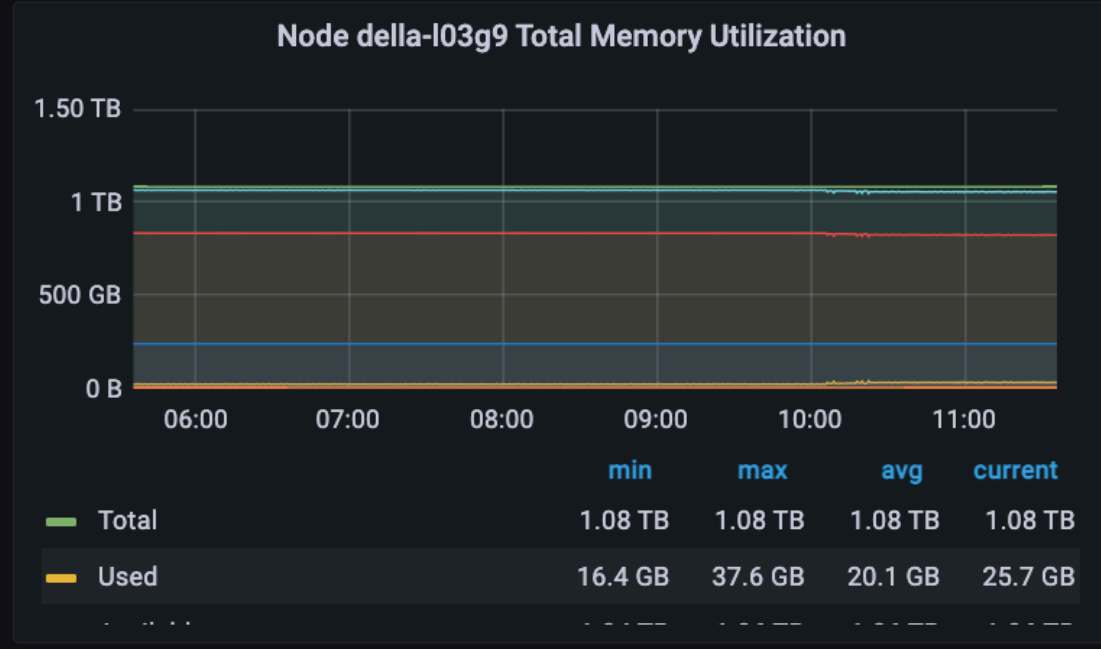
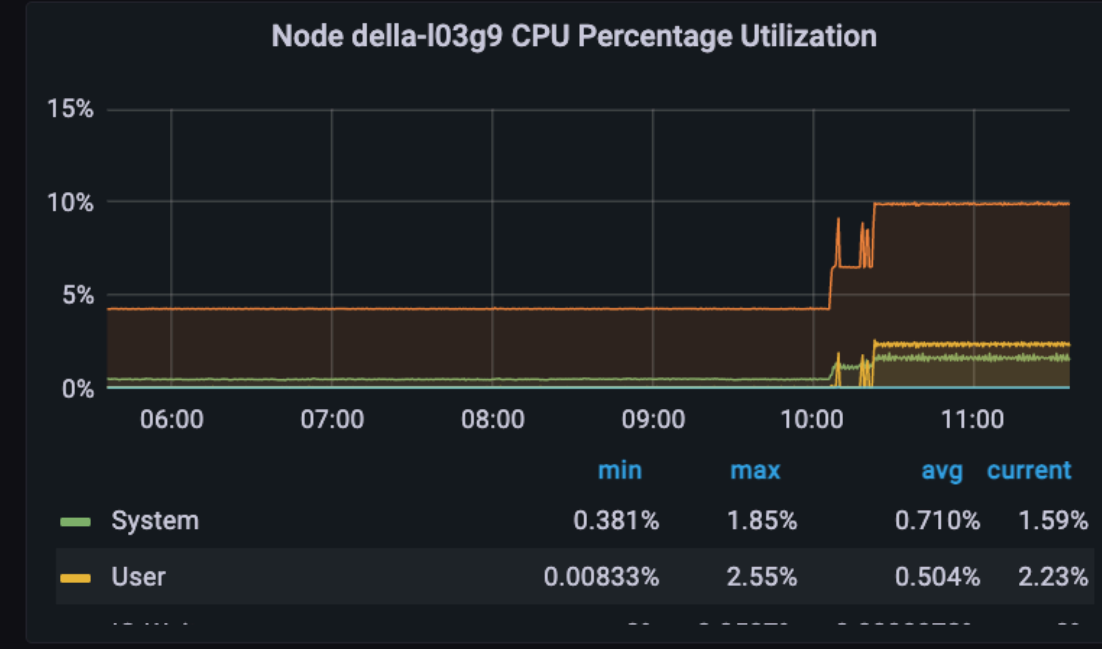
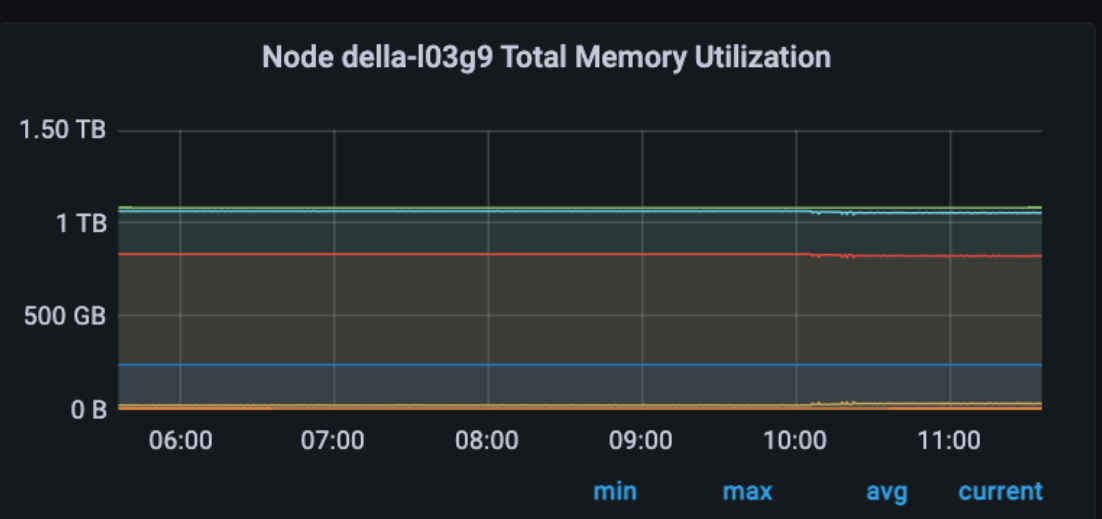
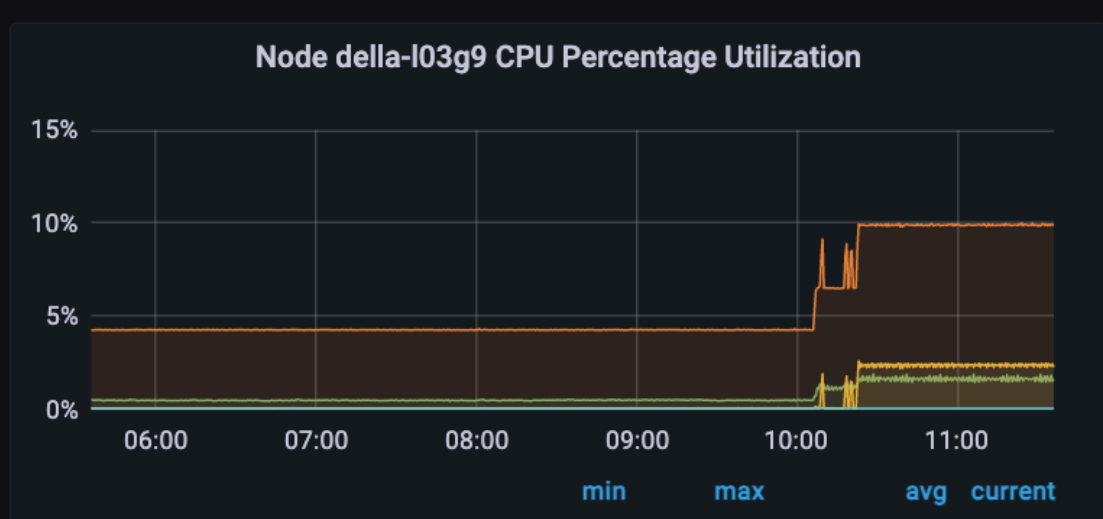
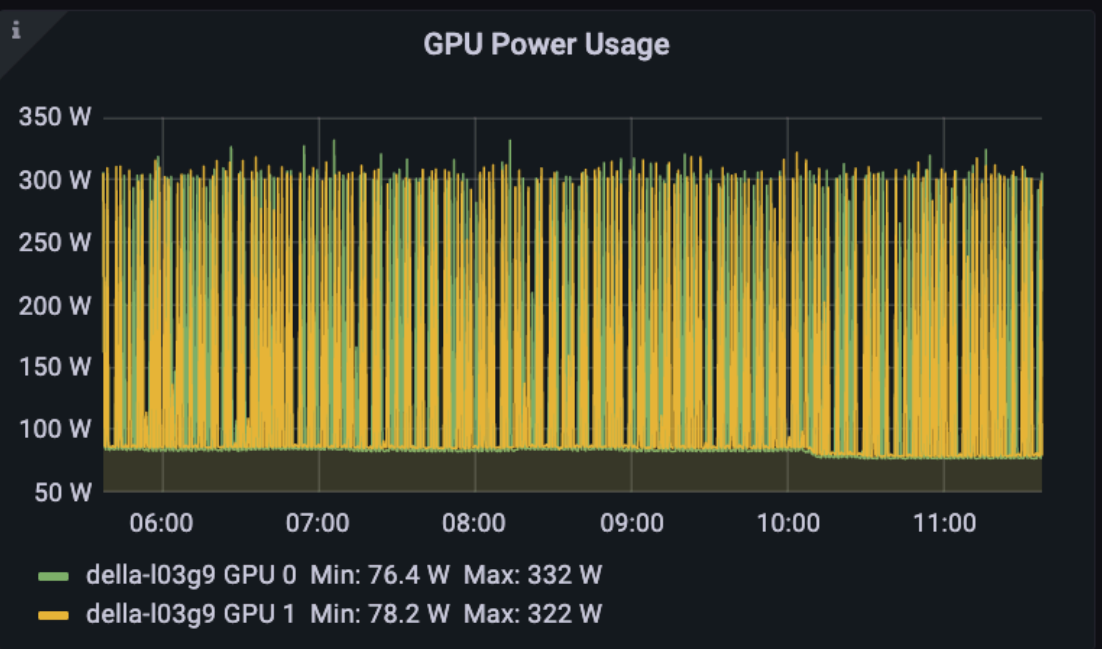
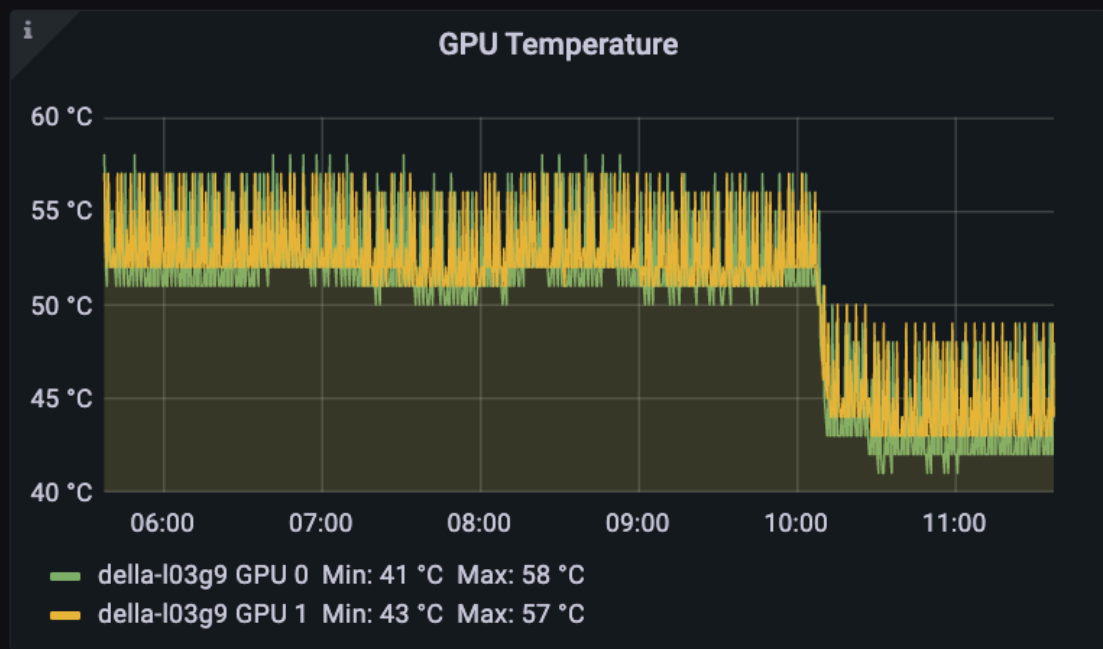
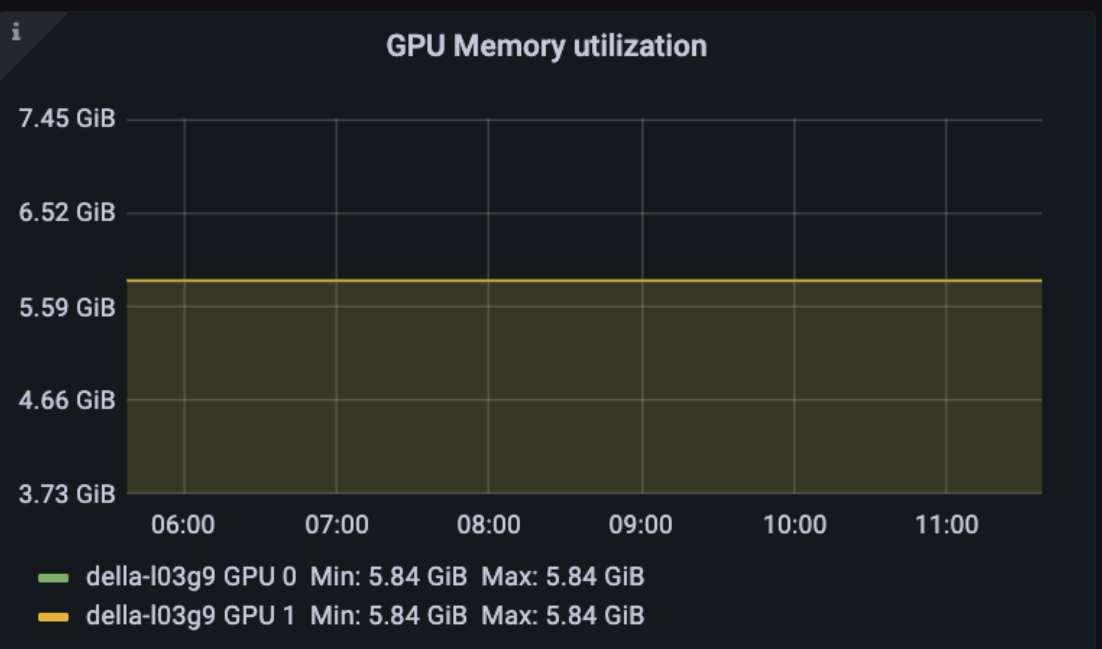
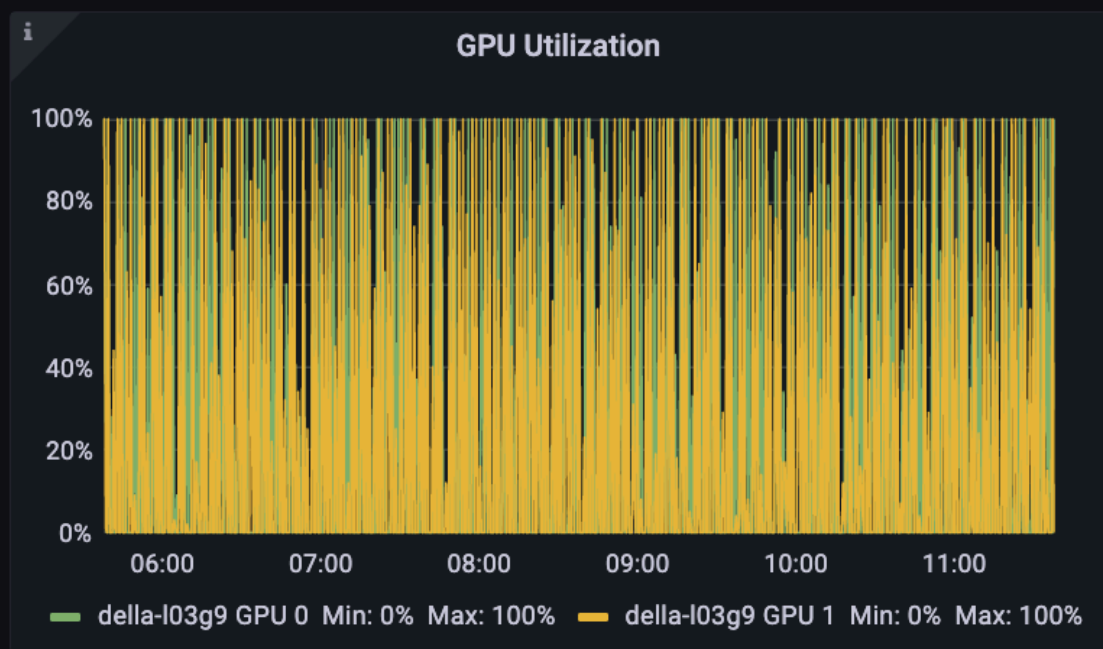


Slurm JobID 45851238 Nodes della-I03g9 Interval 1m

Slurm Stats



GPU Stats



Overview of Jobstats Setup

1. Switch to cgroup based job accounting from Linux process accounting
2. Setup the exporters: cgroup, node, GPU (on the nodes) and, optionally, GPFS (centrally)
3. Setup the `prolog.d` and `epilog.d` scripts on the GPU nodes
4. Setup the Prometheus server and configure it to scrape data from the compute nodes and all configured exporters
5. Setup the `slurmctldepilog.sh` script for long-term job summary retention
6. Lastly, configure Grafana and Open OnDemand

jobstats is a command for generating a detailed job efficiency report

Requirements

- Python 3.6+
- Requests 2.20+
- blessed (optional)

[Visit the GitHub Repository](#)

```
$ jobstats 39798795
=====
                               Slurm Job Statistics
=====
      Job ID: 39798795
  NetID/Account: aturing/math
    Job Name: sys_logic_ordinals
      State: COMPLETED
      Nodes: 2
    CPU Cores: 48
  CPU Memory: 256GB (5.3GB per CPU-core)
      GPUs: 4
  QOS/Partition: della-gpu/gpu
    Cluster: della
  Start Time: Fri Mar 4, 2022 at 1:56 AM
    Run Time: 18:41:56
  Time Limit: 4-00:00:00

=====
                               Overall Utilization
=====
CPU utilization  [|||||]                               10%]
CPU memory usage [|||]                                  6%]
GPU utilization  [|||||||||||||||||||||||||||||||||] 68%]
GPU memory usage [|||||||||||||||||||||||||||||||||] 66%]

=====
                               Detailed Utilization
=====
CPU utilization per node (CPU time used/run time)
  della-i14g2: 1-21:41:20/18-16:46:24 (efficiency=10.2%)
  della-i14g3: 1-18:48:55/18-16:46:24 (efficiency=9.5%)
  Total used/runtime: 3-16:30:16/37-09:32:48, efficiency=9.9%

CPU memory usage per node - used/allocated
  della-i14g2: 7.9GB/128.0GB (335.5MB/5.3GB per core of 24)
  della-i14g3: 7.8GB/128.0GB (334.6MB/5.3GB per core of 24)
  Total used/allocated: 15.7GB/256.0GB (335.1MB/5.3GB per core of 48)

GPU utilization per node
  della-i14g2 (GPU 0): 65.7%
  della-i14g2 (GPU 1): 64.5%
  della-i14g3 (GPU 0): 72.9%
  della-i14g3 (GPU 1): 67.5%

GPU memory usage per node - maximum used/total
  della-i14g2 (GPU 0): 26.5GB/40.0GB (66.2%)
  della-i14g2 (GPU 1): 26.5GB/40.0GB (66.2%)
  della-i14g3 (GPU 0): 26.5GB/40.0GB (66.2%)
  della-i14g3 (GPU 1): 26.5GB/40.0GB (66.2%)

=====
                               Notes
=====
* This job only used 6% of the 256GB of total allocated CPU memory. For
  future jobs, please allocate less memory by using a Slurm directive such
  as --mem-per-cpu=1G or --mem=10G. This will reduce your queue times and
  make the resources available to other users. For more info:
  https://researchcomputing.princeton.edu/support/knowledge-base/memory

* This job only needed 19% of the requested time which was 4-00:00:00. For
  future jobs, please request less time by modifying the --time Slurm
  directive. This will lower your queue times and allow the Slurm job
  scheduler to work more effectively for all users. For more info:
  https://researchcomputing.princeton.edu/support/knowledge-base/slurm

* For additional job metrics including metrics plotted against time:
  https://mydella.princeton.edu/pun/sys/jobstats (VPN required off-campus)
```



```
$ jobstats 39798795
```

=====
Slurm Job Statistics
=====

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GPUs: 4
QOS/Partition: della-gpu/gpu
Cluster: della
Start Time: Fri Mar 4, 2022 at 1:56 AM
Run Time: 18:41:56
Time Limit: 4-00:00:00
```

=====
Overall Utilization
=====

```
CPU utilization [|||||] 10%]
CPU memory usage [|||] 6%]
GPU utilization [|||||||||||||||||||||||||||||||||||||] 68%]
GPU memory usage [|||||||||||||||||||||||||||||||||] 66%]
```

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                        Slurm Job Statistics
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Job ID: 39798795
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```

Detailed Utilization

=====
CPU utilization per node (CPU time used/run time)

della-i14g2: 1-21:41:20/18-16:46:24 (efficiency=10.2%)

della-i14g3: 1-18:48:55/18-16:46:24 (efficiency=9.5%)

Total used/runtime: 3-16:30:16/37-09:32:48, efficiency=9.9%

CPU memory usage per node – used/allocated

della-i14g2: 7.9GB/128.0GB (335.5MB/5.3GB per core of 24)

della-i14g3: 7.8GB/128.0GB (334.6MB/5.3GB per core of 24)

Total used/allocated: 15.7GB/256.0GB (335.1MB/5.3GB per core of 48)

GPU utilization per node

della-i14g2 (GPU 0): 65.7%

della-i14g2 (GPU 1): 64.5%

della-i14g3 (GPU 0): 72.9%

della-i14g3 (GPU 1): 67.5%

GPU memory usage per node – maximum used/total

della-i14g2 (GPU 0): 26.5GB/40.0GB (66.2%)

della-i14g2 (GPU 1): 26.5GB/40.0GB (66.2%)

della-i14g3 (GPU 0): 26.5GB/40.0GB (66.2%)

della-i14g3 (GPU 1): 26.5GB/40.0GB (66.2%)

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=====
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CPU utilization  [|||||                               10%]
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Notes

- * This job only used 6% of the 256GB of total allocated CPU memory. For future jobs, please allocate less memory by using a Slurm directive such as `--mem-per-cpu=1G` or `--mem=10G`. This will reduce your queue times and make the resources available to other users. For more info:
<https://researchcomputing.princeton.edu/support/knowledge-base/memory>
- * This job only needed 19% of the requested time which was 4-00:00:00. For future jobs, please request less time by modifying the `--time` Slurm directive. This will lower your queue times and allow the Slurm job scheduler to work more effectively for all users. For more info:
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- * For additional job metrics including metrics plotted against time:
<https://mydella.princeton.edu/pun/sys/jobstats> (VPN required off-campus)

Summary Statistics

After a job finishes, summary statistics are stored in the `admincomment` field of the Slurm database.

```
sacct [...] -o jobid,user,nnodes,ncpus,...,admincomment
```

summary statistics

```
{
  "gpus": 2,
  "nodes": {
    "della-i14g2": {
      "cpus": 24,
      "gpu_total_memory": {
        "0": 42949672960,
        "1": 42949672960
      },
      "gpu_used_memory": {
        "0": 28453568512,
        "1": 28453568512
      },
      "gpu_utilization": {
        "0": 65.7,
        "1": 64.5
      },
      "total_memory": 137438953472,
      "total_time": 164480.1,
      "used_memory": 8444272640
    }
  }
}
```

- Slurm database grows in size (~5%) depending on the number of nodes per job
- Time-series data is expunged after 6 months while summary statistics are stored permanently

To generate email reports using `jobstats` after a job finishes, modify `slurm.conf`:

```
MailProg=/usr/local/bin/jobstats_mail.sh
```

Users can then receive the `jobstats` output using these Slurm directives:

```
#SBATCH --mail-type=end  
#SBATCH --mail-user=aturing@princeton.edu
```

This allows users to see detailed efficiency information with the custom notes.

What about users that ignore or do not subscribe to these emails?

Job Defense Shield is a Python tool for sending automated email alerts to users with underperforming or misconfigured jobs.

```
$ ./job_defense_shield.py --help
usage: job_defense_shield.py [-h] [--zero-cpu-utilization]
                             [--zero-gpu-utilization]
                             [--zero-util-gpu-hours] [--low-xpu-efficiency]
                             [--datascience] [--excess-cpu-memory] [--mig]
                             [--cpu-fragmentation] [--gpu-fragmentation]
                             [--excessive-time] [--serial-using-multiple]
                             [--longest-queued] [--most-cores] [--most-gpus]
                             [--days N] [-M CLUSTERS] [-r PARTITION]
                             [--num-top-users N] [--files FILES]
                             [--email] [--report] [--check]
```

Requirements

- Python 3.6+
- pandas 1.2+
- jobstats (optional)

[Visit the GitHub Repository](#)

Send emails to users that are over-allocating CPU memory:

```
$ ./job_defense_shield.py --excess-cpu-memory --days=7 --email
```

The software obtains the data, applies filters, and sends the emails. For example:

```
sacct -X -a -P -n -S 7/18 -o jobid,user,nnodes,ncpus,...,admincomment
```

```
import pandas  
df = pandas.DataFrame(...)
```



```
from alert.excess_cpu_memory import ExcessCPUMemory  
xmem = ExcessCPUMemory(df, ...)  
xmem.send_emails_to_users()
```

Alert	Emails Sent per Week	Grace Period
Actively running jobs where a GPU has 0% utilization for longer than 1 hour from start of job	17	1 day
Jobs where a CPU had 0% utilization	6	7 days
Users in the top N by usage with low CPU or GPU utilization (over past 7 days)	3	7 days
Jobs that could have been run on a less powerful GPU (e.g., an NVIDIA MIG GPU versus A100)	6	10 days
Jobs with excessive run time limits	2	7 days
Jobs that request too many CPU nodes (e.g., 1 CPU-core per node over 100 nodes)	13	7 days
Multi-GPU jobs that only allocate 1 GPU per node	1	7 days
Jobs that run a serial code while allocating more than 1 CPU-core	9	7 days
Jobs that use large-memory nodes but do not need them	16	7 days
Jobs that request much more than the default CPU memory but do not use it	4	7 days
Users with over 100 GPU-hours at 0% utilization	1	7 days

Sat May 13 13:59:08 2023: Request 44866 was acted upon.

Transaction: Ticket created by <email>

Queue: General

Subject: Re: Low CPU efficiency on TigerCPU

Owner: Nobody

Requestors: <email>

Ccs: <username>@princeton.edu

Status: new

Ticket <URL: <https://ces.princeton.edu/tickets/Ticket/Display.html?id=44866> >

Thanks to this automated e-mail I found a bug in my job submission scripts which caused the OMP thread count not to be properly passed to the program. I was running it with `srun --ntasks-per-node=10 --cpus-per-task=4 myprogram`. I thought the `--cpus-per-task=4` part would take care of setting up the OMP variables, but apparently it doesn't. So now I use `OMP_NUM_THREADS=4 srun --ntasks-per-node=10 --cpus-per-task=4 myprogram`. The bug has been present in my run scripts for about two months, including when I ran some quite costly jobs, sadly. But at least it's fixed now. Sorry about that.

reportseff is a command for displaying a simple Slurm efficiency report for several jobs at once.

```
$ reportseff
```

JobID	User	State	Start	Elapsed	Timelimit	NNodes	NCPUS	ReqMem	Partition	CPUEff	MemEff	GPUEff	GPUMem
48461674	jd4	COMPLETED	2023-06-12	00:00:09	01:06:00	1	1	4G	gpu	33.3%	0.0%	---	---
48463751	jd4	FAILED	2023-06-12	00:00:00	01:06:00	1	1	4G	gpu	---	0.0%	---	---
48463796	jd4	COMPLETED	2023-06-12	00:00:11	01:06:00	1	1	4G	gpu	63.6%	0.0%	---	---
48463979	jd4	CANCELLED	None	00:00:00	00:05:00	1	1	4G	gputest	---	0.0%	---	---
48463980	jd4	COMPLETED	2023-06-12	00:00:12	01:05:00	1	1	4G	gpu	---	0.0%	---	---
48463989	jd4	CANCELLED	2023-06-12	00:13:27	01:05:00	1	1	4G	gpu	0.3%	0.7%	0.0%	0.8%
48464041	jd4	COMPLETED	2023-06-12	00:11:35	01:06:00	1	1	4G	gpu	92.6%	72.0%	18.9%	2.8%
48474781	jd4	COMPLETED	2023-06-12	00:01:38	00:05:00	1	1	4G	gputest	0.2%	0.6%	0.0%	0.8%
48486321	jd4	COMPLETED	2023-06-13	00:00:24	00:05:00	1	1	4G	gputest	4.2%	0.0%	---	---
48486344	jd4	COMPLETED	2023-06-13	00:00:23	00:05:00	1	1	4G	gputest	---	0.0%	---	---
48486357	jd4	CANCELLED	None	00:00:00	01:05:00	1	1	4G	gpu	---	0.0%	---	---
48486358	jd4	CANCELLED	None	00:00:00	01:05:00	1	1	32000M	mig	---	0.0%	---	---
48487363	jd4	COMPLETED	2023-06-13	00:17:01	01:05:00	1	1	32000M	mig	---	0.1%	0.0%	0.0%
48506000	jd4	COMPLETED	2023-06-14	00:00:04	00:20:00	1	1	4G	gputest	---	0.0%	---	---
48865465	jd4	COMPLETED	2023-06-29	00:00:11	16:40:00	1	1	4G	gpu	---	0.0%	---	---
48865468	jd4	CANCELLED	None	00:00:00	16:40:00	1	1	4G	gpu	---	0.0%	---	---
48952062	jd4	COMPLETED	2023-07-03	00:07:55	01:00:00	1	1	32000M	mig	0.9%	0.8%	0.0%	0.0%
49227318	jd4	COMPLETED	2023-07-14	00:00:42	00:05:00	1	1	4G	gputest	61.9%	96.1%	---	---
49227340	jd4	COMPLETED	2023-07-14	00:00:42	00:50:00	1	1	4G	gputest	61.9%	96.2%	---	---
49227561	jd4	OUT_OF_MEM	2023-07-14	00:31:08	00:50:00	1	1	4G	gputest	98.6%	98.5%	15.6%	98.6%
49228551	jd4	TIMEOUT	2023-07-14	00:10:29	00:05:00	1	1	4G	gputest	---	0.6%	0.0%	0.8%
49365843	jd4	COMPLETED	2023-07-21	00:00:32	01:15:00	1	1	4G	gpu	---	0.0%	---	---
49452370	jd4	COMPLETED	2023-07-24	00:00:28	01:00:00	1	32	128G	gputest	72.5%	0.0%	---	---
49452375	jd4	COMPLETED	2023-07-24	00:54:55	01:00:00	1	32	128G	gputest	99.1%	4.8%	48.4%	5.1%

Requirements

- Python 3.7+
- click 6.7+
- jobstats (optional)

 v2.7.5

[GitHub Repository](#)

GPU Dashboard

gpudash is a command that generates a text-based dashboard showing the utilization of each GPU on the cluster

Requirements

- Python 3.6+
- blessed 1.17+

[Visit GitHub Repository](#)

```
$ gpudash
```

```
GPU UTILIZATION (Mon Mar 6)
```

		9:00 AM	9:10 AM	9:20 AM	9:30 AM	9:40 AM	9:50 AM	10:00 AM
comp-g1	0	ho895:97	ho895:98	ho895:98	ho895:97	ho895:97	ho895:98	ho895:97
	1	ho895:98	ho895:97	ho895:97	ho895:98	ho895:98	ho895:99	ho895:99
	2	bi153:86	bi153:86	bi153:86	bi153:86	bi153:86	bi153:86	bi153:86
	3	or417:83	or417:96	or417:98	or417:57	or417:98	or417:98	or417:86
comp-g2	0	tc756:24	tc756:28	tc756:26	tc756:25	tc756:24	tc756:0	tc756:0
	1	tc756:57	tc756:58	tc756:58	tc756:58	tc756:57	tc756:56	tc756:56
	2	tc756:44	tc756:45	tc756:44	tc756:43	tc756:40	tc756:54	tc756:55
	3	tc756:16	tc756:16	tc756:16	tc756:16	tc756:16	tc756:0	tc756:0
comp-g3	0	kt284:86	kt284:80	kt284:87	kt284:41	kt284:83	kt284:83	kt284:88
	1	kt284:86	kt284:85	kt284:80	kt284:1	kt284:81	kt284:82	kt284:85
	2	kt284:83	kt284:84	kt284:84	kt284:18	kt284:87	kt284:81	kt284:88
	3	kt284:86	kt284:83	kt284:84	kt284:40	kt284:83	kt284:80	kt284:87
comp-g4	0	bi153:86	bi153:85	bi153:86	bi153:85	bi153:86	bi153:85	bi153:86
	1	dn214:84	dn214:54	dn214:74	dn214:77	dn214:79	dn214:71	dn214:8
	2	pw351:0	pw351:0	pw351:0	pw351:0	pw351:0	ib377:0	ib377:0
	3	dn214:65	dn214:54	dn214:52	dn214:63	dn214:59	dn214:63	dn214:14
comp-g5	0	vs828:76	vs828:72	vs828:70	vs828:65	vs828:72	vs828:72	vs828:70
	1	vs828:76	vs828:64	vs828:70	vs828:64	vs828:68	vs828:66	vs828:65
	2	vs828:73	vs828:69	vs828:74	vs828:67	vs828:71	vs828:72	vs828:73
	3	th845:99	th845:99	th845:98	th845:98	th845:97	th845:97	th845:97
comp-g6	0	IDLE	IDLE	IDLE	IDLE	n1827:84	n1827:90	n1827:87
	1	IDLE	IDLE	IDLE	IDLE	IDLE	n1827:81	n1827:88
	2	IDLE	IDLE	IDLE	IDLE	IDLE	n1827:81	n1827:79
	3	sy414:12	IDLE	IDLE	IDLE	IDLE	n1827:89	n1827:92
comp-g7	0	pn417:89	pn417:88	pn417:70	pn417:90	pn417:81	pn417:79	pn417:64
	1	pn417:52	pn417:51	pn417:47	pn417:76	pn417:78	pn417:79	pn417:75
	2	th845:99	th845:98	th845:99	th845:99	th845:98	th845:98	th845:98
	3	pn417:98	pn417:99	pw351:0	pn417:33	pn417:43	pn417:61	pn417:35

- GPU utilization is 0%
- GPU utilization is 0-25%
- GPU utilization is 25-50%
- GPU utilization is 50-75%
- GPU utilization is 75-100%

Utilization Reports

utilization reports is a tool for sending detailed usage reports to users and group leaders by email

Visit the [GitHub Repository](#)

```
$ ./utilization_reports.py --report-type=sponsors --months=3
$ ./utilization_reports.py --report-type=users --months=1
```

Requirements

- Python 3.6+
- pandas 1.2+

Sponsor: Garegin Andrea (gandrea)
Period: Nov 1, 2021 - Jan 31, 2022

Della

User	Name	CPU-hours	GPU-hours	Jobs	Account	Partition(s)
edevonte	Egino Devonte	125017 (59%)	0	3465	phys	cpu
mlakshmi	Moacir Lakshmi	82638 (39%)	0	63	arch	cpu,ds
rgozde	Robert Gözde	4238 (2%)	1018	255	chem	cpu,gpu

Your group used 211893 CPU-hours or 1.7% of the 12321247 total CPU-hours on Della. Your group is ranked 20 of 169 by CPU-hours used. Similarly, your group used 1018 GPU-hours or 1.2% of the 88329 total GPU-hours yielding a ranking of 18 of 169 by GPU-hours used.

Tiger

User	Name	CPU-hours	GPU-hours	Jobs	Account	Partition(s)
jiryna	Jaxson Iryna	1065273 (92%)	0	252	math	serial
sime	Shahnaz Ime	98071 (8%)	3250	192	pol	gpu

Your group used 1163344 CPU-hours or 3.0% of the 35509100 total CPU-hours on Tiger. Your group is ranked 7 of 101 by CPU-hours used. Similarly, your group used 3250 GPU-hours or 0.6% of the 554101 total GPU-hours yielding a ranking of 45 of 101 by GPU-hours used.

Detailed Breakdown

Cluster	User	Partition	CPU-hours	CPU-rank	CPU-eff	GPU-hours	GPU-rank	GPU-eff	Jobs
Della	edevonte	cpu	125017	12/231	88%	N/A	N/A	N/A	3465
Della	mlakshmi	cpu	80638	121/231	68%	N/A	N/A	N/A	11
Della	mlakshmi	ds	2000	2/16	71%	N/A	N/A	N/A	22
Della	rgozde	cpu	3238	6/79	95%	N/A	N/A	N/A	41
Della	rgozde	gpu	1000	16/49	91%	250	7/17	52%	101
Tiger	jiryna	serial	1065273	17/22	91%	N/A	N/A	N/A	252
Tiger	sime	gpu	98071	26/41	9%	3250	29/41	17%	192

Future Work

- Acquire more GPU metrics (e.g., Tensor Core usage, occupancy, memory bandwidth)
- Start working with metrics for data storage (which is available from Prometheus)
- Publish jobstats, job defense shield and other tools to PyPI

Summary

- The Jobstats job monitoring platform and tools have improved the ease-of-use and efficiency of our systems
- Only a standard server is required to run the platform
- The jobstats custom notes and the job defense shield emails guide users in an automated way

For getting started with the Jobstats platform: <https://github.com/PrincetonUniversity/jobstats>

For support or questions: cses@princeton.edu