



# **Unlocking the Potential of HPC Systems Use** for Optimizing Job Queues, Minimizing Wait **Times, and Boosting Efficiency**

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- 1 Motivation, Dataset, and Job Queues
- 2 Why do HPC jobs wait in job queues?
- 3 Are queue selection and configuration appropriate?
- 4 How to automatically detect problem cases?
- 5 Open Questions, Future Work, and Take-Aways

## Motivation

#### **Problem Statement**

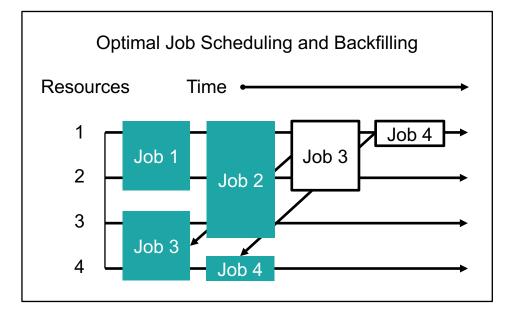
Unnecessary job wait time caused by inaccurate resource requests and low job efficiency.

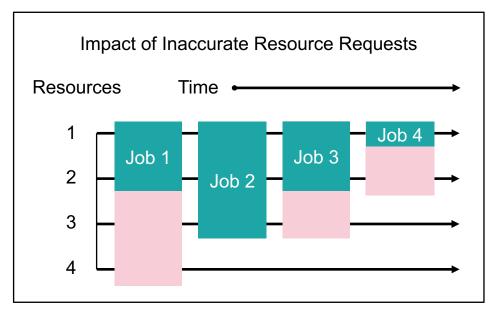
#### Challenge

A job's wait time is not always avoidable even on fully utilized systems – sometimes resources are busy.

#### **Analysis Goal**

- Understand and avoid "unnecessary" job wait time caused by inaccurate resource requests.
- Improve system utilization and efficiency.





#### **Dataset and Job Queues**

Timespan	Jan – Aug 2023	Queues	%Jobs	%CPUh	%Backfill	%Wait Time
#Accounts	~150	30min	75.8%	12.3%	77.2%	34.1%
#Users	~500	6hours	22.0%	49.3%	52.1%	43.6%
#Jobs	~55 million	1day	1.9%	20.9%	30.4%	21.1%
CPU Hours	~20 million	1week	0.1%	12.6%	27.9%	1.0%
GPU Hours	~100 thousand	2weeks	>0.1%	0.8%	36.0%	>0.1%

Shorter queues offer access to more resources.

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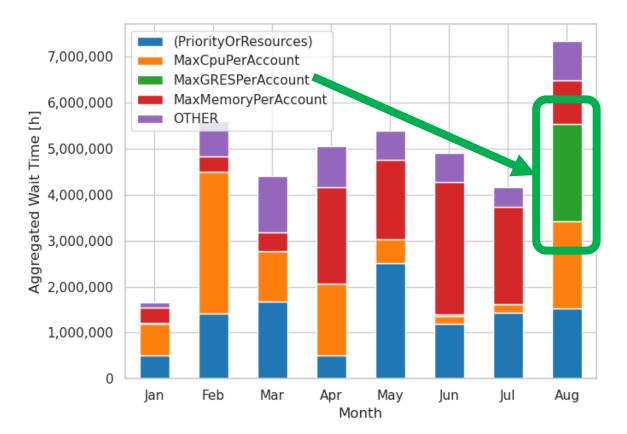
## Relation between Job Resource Requests, Wait Time, and Backfilling

- We investigate positive and negative correlations for the top 10 users by wait time.
- More requested resources correlate with higher wait times and less backfilling.
- Requested memory plays a higher role than requested CPUs, even higher than Timelimit.

Pearson Linear Correlation Coefficient (-1 to 1)					
	Avg. Wait Time	Backfilling			
Avg. Timelimit	0.58	-0.69			
Avg. ReqCPUS	0.45	-0.63			
Avg. ReqMem	0.70	-0.87			

## Wait Reasons per Month

- Slurm retains a wait reason per job other than
   Priority or Resources, in that case it stores "None".
- MaxCpuPerAccount and MaxMemoryPerAccount are limits per account and per queue.
- MaxGRESPerAccount is a GPU limit also per account and per queue.
- GPU limit wait time happened mostly in August 2023!

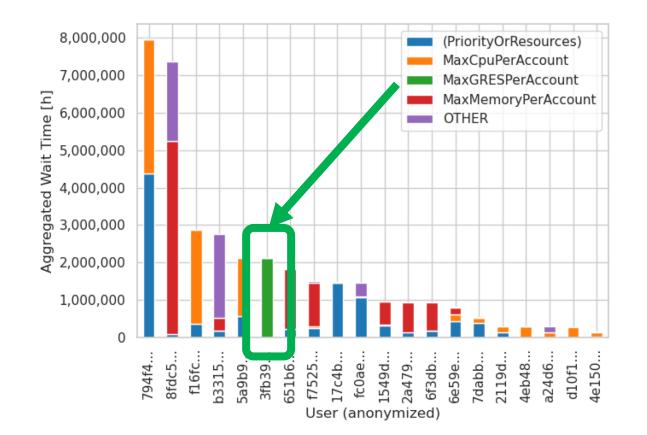


## Wait Reasons by User

- The top ten users aggregate~80% of the total wait time.
- Users wait either due to CPU limits or Memory limits, but not both.

The GPU wait case becomes more interesting:

 $\succ$  now we know it only affects one of the top users.

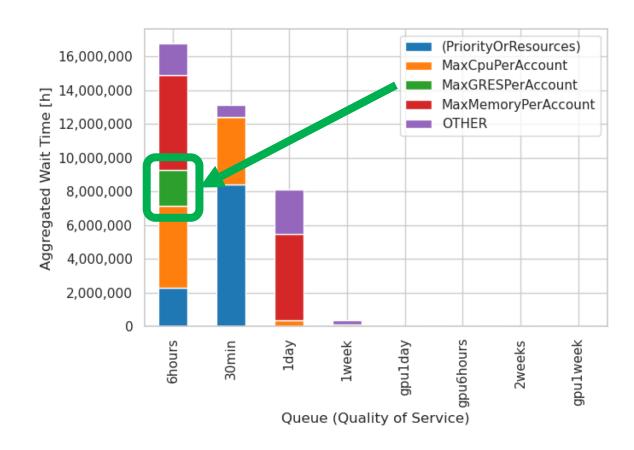


## Wait Reasons per Queue

- ➢ 6hours queue experiences most of the wait time.
- ➢ 30min queue has almost no Memory limit wait time.
- Iday queue has almost no CPU limit wait time.

Conclusion to the GPU limit wait case:

- Jobs were submitted to the "normal" 6hours queue (limited to 16 GPUs) instead of the dedicated gpu6hours queue (access to 40 GPUs).
- The GPU limit wait case is a good example of unnecessary wait time due to misconfiguration.



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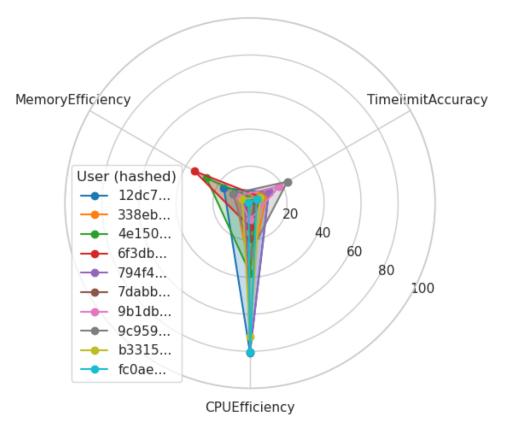
## **Potential to Improve Appropriate Queue Submissions**

- We consider submission to a shorter queue possible if the job execution time \* 2 <= Timelimit of the shorter queue (100% buffer/overestimation).
- The majority of the jobs from 6hours, 1day, 1week, and 2weeks queues could have been submitted to shorter queues.
- We know that submission to shorter queues is desirable, due to more access to resources, more backfilling and lower job wait times.

Submission Queue	Number of Jobs	% of Jobs where Submission to Shorter Queue was Possible
30min	39'820'630	already shortest queue
6hours	11'545'374	80.7%
1day	1'000'464	94.2%
1week	54'341	93.0%
2weeks	8'26	90.1%

## **Potential for Appropriate Resource Requests**

- The plot shows the top 10 users by CPUh.
- We observe high potential for these users to improve TimelimitAccuracy and MemoryEfficiency.
- The problem with overestimating memory
  - the job waits longer itself
  - the job blocks memory for other jobs
  - this makes job scheduling difficult
  - ultimately degrades the service for every job



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## **Appropriate Queue Recommendation**

- Reporting TimelimitAccuracy for individual jobs may not be the best approach to support users (see tools: sacct, jobstats, reportseff, etc.).
- We identify working directories that are the origin of overestimated jobs.
- Users potentially benefit and adapt to more coarse grained queue recommendations.

WorkDir (hashed)	#Jobs	Max Exec. Time	Queue Chosen by User	Recommended Queue
e711e	101'077	0:03:33	6hours	30min
b9239	48'833	0:01:18	6hours	30min
3b843	25'686	1:28:59	1day	6hours

## **Detecting Problem Cases that Aggregate Specific Wait Time**

- It can be an indication of misconfiguration if all jobs from a specific working directory are waiting only for one reason.
- Indeed we see a return of the GPU limit wait case! 99% of the wait time of all jobs from this working directory are due to GPU limits. Which could be avoided by submitting to the appropriate GPU queue.
- This form of reason-based analysis can support the detection of misconfiguration and problem cases.

WorkDir (hashed)	#Jobs	Wait Time [h]	Top Reason for 99% of Wait Time
a48a2	13'608	2'107'958	MaxGRESPerAccount
5bc88	8'206	290'445	MaxCpuPerAccount
d29c0	21'125	222'892	MaxMemoryPerAccount

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## **Open Questions and Future Work**

#### **Open Questions**

- What are the reasons for overestimation?
  - a) Fear of timeouts?
  - b) Misconfiguration/application crashes?
  - c) "Mindlessness"?
- How to incentivize users to submit more accurate resource requests?
  - a) Command-line tool support?
  - b) Include Accuracy/Efficiency into Job Priority?

#### **Future Work**

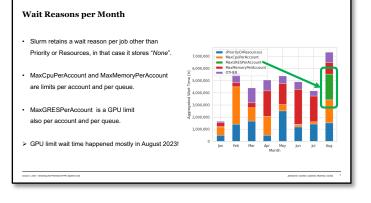
- Fine tune Queue CPU and Memory limits.
- Investigate the impact of overestimation on blocking nodes for other jobs.
- Develop user support tools to automatically detect
  - a) misconfigured jobs (GPU jobs on CPU nodes),
  - b) bulk submissions to inappropriate queues,
  - c) aggregation of specific wait time by reason.

## **Take-Away Messages**

#### Backfilling works as intended

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			Shorter queues	offer access to	more resources	-

#### Different job wait reasons



#### Appropriate queue submission

#### Potential to Improve Appropriate Queue Submissions We consider submission to a shorter queue Number of % of Jobs where Submission to Shorter Queue was Possible Queue possible if the job execution time \* 2 <= Timelimit Jobs of the shorter queue (100% buffer/overestimation). 39'820'630 already shortest queue 30mir The majority of the jobs from 6hours, 1day, 1week, 6hours 11'545'374 80.7% and 2weeks queues could have been submitted to shorter queues. 1day 1'000'464 94.2% We know that submission to shorter queues is 1week 54'341 93.0% desirable, due to more access to resources, more backfilling and lower job wait times. 90.1% 2weeks 8'26 notes 1, 2023 - Unitating the Polential of HPC Bydems Use Jakobache, Cavelan, Cabecon, Mar

#### Low resource request accuracy

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<ul> <li>The problem with overestimating memory</li> <li>the job waits longer itself</li> <li>the job blocks memory for other jobs</li> <li>this makes job scheduling difficult</li> <li>ultimately degrades the service for every job</li> </ul>	User (nashed) + 33862 + 33862 + 73462 + 73482 + 91953 + 91953 + 91953 - 7044 + 91953 - 7044 - 73482 - 73482

#### Automatically detect problem cases

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#### Opportunity to improve scheduling

Motivation	Optimal Job Scheduling and Backfilling Resources Time
<ul> <li>Problem Statement</li> <li>Unnecessary job wait time caused by inaccurate resource requests and low job efficiency.</li> <li>Challenge</li> </ul>	1 2 3 4 3 4 3 4 3 4 3 3 3 3 3 3 3 3 3 3 3
A job's wait time is not always avoidable even on fully utilized systems – sometimes resources are busy.	Impact of Inaccurate Resource Requests Resources Time
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