CMSC714 Lecture 20 **Job Scheduling** Alan Sussman (mostly from Abhinav Bhatele)





- Midterm exam on Thursday, November 10
 - Sample questions posted on Exams web page ٠
- Interim report for group project due Monday, 6PM



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Job Queue



Two components of a scheduler

Decide what job(s) to schedule next: scheduler

Decide what nodes (and other resources) to allocate to them: resource manager



Scheduling policies

- First come first serve (FCFS)
- **Priority-based**
 - Depending on project name and remaining allocation
- Backfilling
 - Use idle nodes that are being reserved for the next large jobs
 - Aggressive (EAZY) backfill: run jobs as long as they don't delay the first job in the queue (could lead to unbounded delays)
 - Conservative backfill: runs jobs as long as they don't delay **any** future job



Resource management

- Most primitive: manage nodes
- Advanced management:
 - Node type aware (low vs. high memory, GPU nodes, etc.)
 - Network topology aware
 - Power aware



Space sharing and time sharing

- Space sharing: Exclusive access to a resource until job completion
- Time sharing: Interleaved access to the same resource
 - Co-scheduling
 - Gang scheduling



Quality of service metrics

• Job Wait Time: time between a job's submission and start

 $T_{\text{wait}} = T_{\text{start}} - T_{\text{submit}}$

Slowdown: incorporates running time of a job





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Quality of service metrics

System Utilization: fraction of nodes allocated to running jobs at a given time

 $utilization_t = \frac{N_t}{N}$

Schedule Makespan: time between the first job's submission and last job's completion for a job trace (workload)





PBS paper - Takeaways

- Separating job scheduling policy from resource management makes it possible for sites to manage their own resources as they see fit - to optimize for throughput, give priority to specific groups of users (at certain times), or whatever the resource owner desires
 - The real power is in managing clusters to run parallel (e.g., MPI) jobs, not single machines as is mainly discussed in the paper
- PBS is the beginning of a lot of efforts at schedulers for clusters, including SLURM
 - Eventually 2 companies formed to support PBS, and later a derivative called Torque (PBS) and Torque were both used on UMD clusters, before SLURM)
 - An open source version, OpenPBS, is still used, but at many sites has been supplanted by SLURM



Gang Scheduling/Backfilling paper

- A study to take a careful look at the benefits of the two scheduling methods, which are complementary
 - Conclusion is that backfilling is the big win, since it allows for utilizing resource that would otherwise go unused with a FCFS policy, or other standard policies
 - But gang scheduling helps by enabling multiple jobs to utilize the same nodes at the same time – time sharing in addition to space sharing
 - Gang scheduling ensures that all processes for the same job run at the same time (really important for MPI, and other parallel, jobs)
 - Multiprogramming level does not seem to matter all that much, once it is more than 1
 - And higher levels of over-estimation of job run times do not seem to hurt much, especially when using both gang scheduling and backfilling
 - For all the metrics, including responsiveness, slowdown, fairness, and utilization

