CMSC714
Lecture 21
Job Scheduling
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(mostly from Abhinav Bhatele)



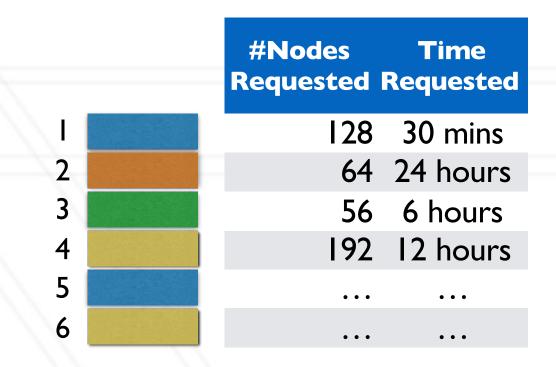
#### Notes

- Midterm exam next Thursday, November 16, in class
  - Sample questions posted on Exams web page
  - Email me if you are out of town next week, to arrange a time to take the exam
- Interim report for group project due Monday, 6PM
- No class Tuesday



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- Each user submits their parallel programs for execution to a "job" scheduler

#### Job Queue





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  - what job to schedule next (based on an algorithm: FCFS, priority-based, ....)
  - what resources (compute nodes) to allocate to the ready job

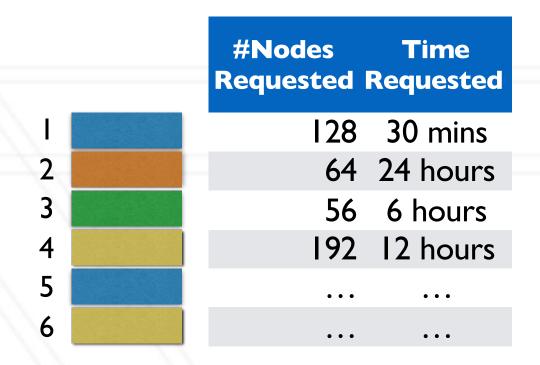
#### Job Queue

|   | #Nodes<br>Requested |          |
|---|---------------------|----------|
| I | 128                 | 30 mins  |
| 2 | 64                  | 24 hours |
| 3 | 56                  | 6 hours  |
| 4 | 192                 | 12 hours |
| 5 | • • •               | • • •    |
| 6 | • • •               | • • •    |



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  - Network, filesystem(s): shared by all jobs

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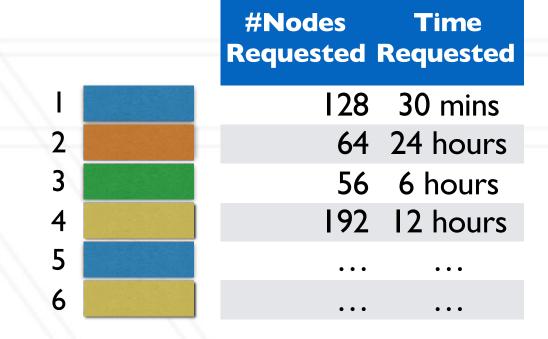


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Job Queue

Concurrently running jobs can

contend for shared resources:



## 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

Slowdown = 
$$\frac{T_{\text{wait}} + T_{\text{running}}}{T_{\text{running}}}$$

# 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 resources 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

