

## On the Quality of Wall Time Estimates for Resource Allocation Prediction

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#### **Overview**

#### Motivation

- Problem
- Metric
- Results
- Conclusion & take away

## **Motivation**



The I/O Subsystem (parallel FS) is a bottleneck in HPC Systems

- Bandwidth, metadata or latency
- Data Staging in advance to compute node
- Which nodes are going to be allocated?
- Wall times are far away from optimal
- How good wall time predictions have to be?

## **Goal: Data staging in advance**





- Based on the allocation prediction
- No modification on scheduling behaviour
- How reliable is the schedule?

## Scenario 1: Backfill-Scheduling





#### **Existing Schedule**



#### Backfilling re-shuffles planned schedule

#### Scenario 2: Forward jump in schedule Node 1 Job 1 Node 2 Job 6 Job 4 Node 3 Job 2 Node 4 Node 5 Node 6 Job 3 Job 5 Node 7 Node 8



### How to solve



- Many other cases cause reschedule
  - Node failure
  - Other nodes earlier free
  - High priority jobs
- Need accurate wall time estimates
  - Reduces need for back-filling
  - No jumping forward in schedule
  - Keep cluster utilization high  $\leftarrow$
- Many approaches to predict wall time estimates Simple Rules, Machine Learning (ML), Automatic ML, Deep learning

## **Evaluation**



- Not another wall time predictor
  - Impact of accurate wall time on node prediction
- Improve wall times artificially ("redefined" requested wall time)
  - No under-estimations
- Workloads from the parallel workload archiv
  - CTC, SDSC, KTH, ForHLR II\*
- ALEA new feature developed
  - Node allocation tracking





Calculate for every job a new wall time estimate based on  $\lambda_x$  for given x

## **Requested / used walltime**





#### User request more than they use

 ForHLR 3.5X requested wall time than used wall time SDSC 2.5X CTC 2.0X KTH 1.5X

## Improved wall times estimates





CTC improved estimates

#### Metric



Categorized into valid node allocation prediction time (T<sub>NAP</sub>)

>10 minutes before job start the node allocation list is known

1 seconds – 10 minutes

0 seconds – 1 second

Instant started jobs

#### **Results – CTC - FCFS**





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## **Results – CTC - Back-filling**





## **Conclusion & Take Away**



- With FCFS higher accuracy on node allocations
- Alea wall time predictor is quite good if user estimations are bad

#### But still: Even with perfect wall times there is a huge uncertainty

- Alea can now simulate node allocation prediction
- Modification to scheduling needed for advanced data staging
  - Reservations
  - Slurm ODFS Burst buffer plugin

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# Questions?