

# TetriSched: Global Rescheduling with Adaptive Plan-ahead in Dynamic Heterogeneous Clusters



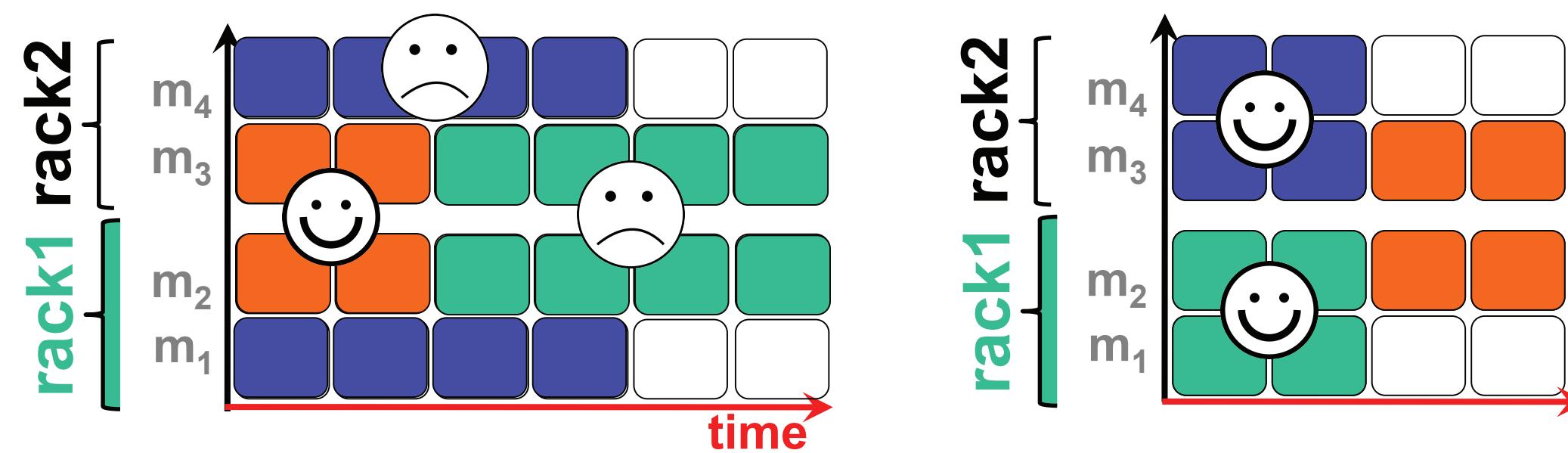
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## Background

- Clusters are increasingly heterogeneous
  - Resource types: GPUs, FPGAs, large RAM
  - Topology: rack locality, failure domains, loaded data
- Workloads vary in time and resource needs
  - E.g., best-effort analytics vs. SLO jobs w/ deadlines
  - E.g., 2hrs on 5xGPU or 4hrs on 10xCPU
- Current schedulers don't exploit this flexibility well
  - Results: wasted resources, missed deadlines, high latency

## Problem Statement

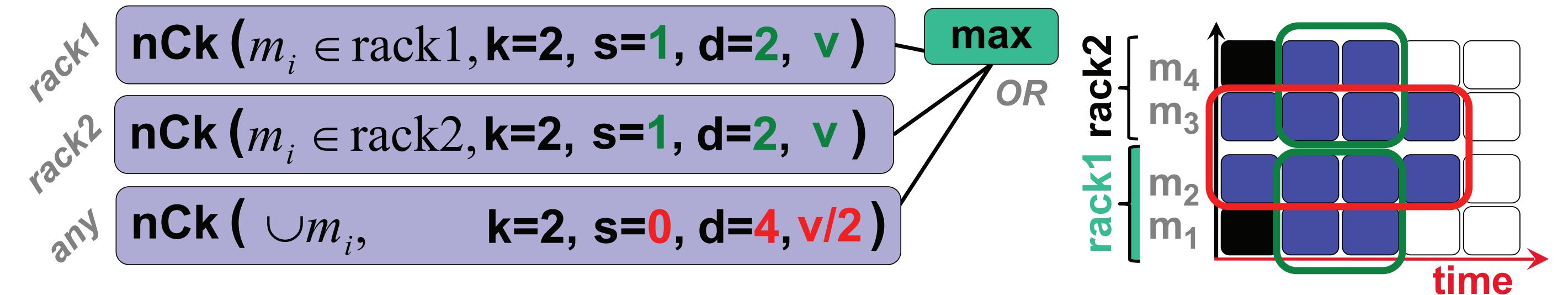
- Heterogeneity results in many placement options
  - Which resources/types to allocate? (space)
  - Run now or wait for better resource? (time)
- Key challenges
  - Express and quantify combinatorially many options
  - Leverage runtime estimates robustly
  - Exploit this knowledge to improve allocation efficiently



- Anti-Affinity:** 2 tasks preferably on different racks (best-effort)
- MPI:** 2 tasks preferably on same rack (done by t=3)
- GPU:** 2 tasks preferably on GPU nodes (rack1) (done by t=3)

## Space-Time Request Language

- [R1] space-time constraint awareness
- [R2] soft constraints (preference) awareness
- [R3] combinatorial constraints
- [R4] gang scheduling
- [R5] composability for global scheduling



## Experimental Results

- Real Cluster: 256 nodes
- Workload: FB2009 SLO + Yahoo BE (SWIM)
- Rayon/TetriSched >> Rayon/CapacitySched
- Real Cluster: 80 nodes
- Workload: synthetic GPU + MPI + BE
- Soft constraints: 2x perf boost
- Real Cluster: 80 nodes
- Workload: synthetic GPU + MPI + BE
- Plan-ahead + global scheduling: 2.5x performance boost over baseline

