

Design and Comparison of Resilient Scheduling Heuristics for Parallel Jobs

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What Is This Paper About?

On large-scale HPC platforms:

- **Scheduling parallel jobs** is important to improve application performance and system utilization;
- **Handling job failures** is critical as failure/error rates increase dramatically with size of system.

This paper combines **job scheduling** and **failure handling** for parallel jobs running on large HPC platforms prone to failures.

Scheduling Models

Job Model:

- n rigid parallel jobs all released at time 0 (i.e., batched);
- each job has a processor request p_j and an execution time t_j ;
- Jobs are to be scheduled on a set of P identical processors.

Error Model:

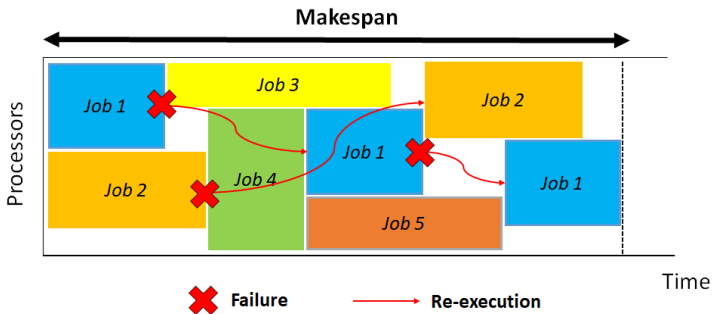
- Jobs are subject to silent errors (or silent data corruptions);
- Silent error detector (of negligible cost) is available to flag errors at the end of each job's execution;
- If a job is hit by silent errors, it must be re-executed (possibly multiple times) till successful completion;

Objective:

- Minimize the makespan (i.e., successful completion time of all jobs);
- Number of failures for each job is unknown a priori;
- No assumption on error rate or distribution.

A **failure scenario** $\mathbf{f} = (f_1, f_2, \dots, f_n)$ describes the number of failures each job experiences during a particular execution.

Example: $\mathbf{f} = (2, 1, 0, 0, 0)$ for an execution of five jobs.

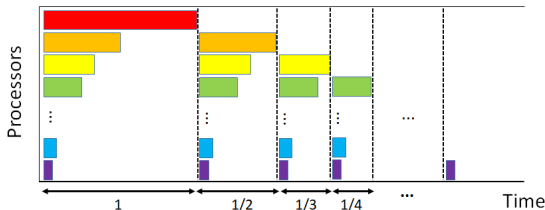


Main Results

- 1 A **resilient list-based scheduling** algorithm, and $O(1)$ -approximations for **any failure scenario**:
 - 2-approximation using Greedy heuristic without reservation;
 - 3-approximation using Large Job First priority with reservation.

The results nicely extend the ones without job failures [TWY'92].

- 2 A **resilient shelf-based scheduling** heuristic, but $\Omega(\log P)$ -approx. for **any shelf-based solution** in some failure scenario, e.g.:



The result defies the $O(1)$ -approx. result without failures [TWY'92].

- 3 **Extensive simulation results** of all heuristics using both synthetic jobs and job traces from the Mira supercomputer.

Relations with Similar Models

Offline/online scheduling with job release times [NS'02, Johannes'06]:

- In this model, jobs have fixed release times \Rightarrow 2-approx. for list.
- In our model, “new job releases” (corresponding to failed jobs restarting) depend on scheduling decisions \Rightarrow 2-approx. for list.

Online one-by-one scheduling of parallel jobs [HP'08, YHZ'09]:

- In this model, independent jobs must be scheduled one-by-one without future knowledge $\Rightarrow O(1)$ -approx. for shelf.
- In our model, no immediate scheduling is required, but (failed) jobs form dependencies $\Rightarrow \Omega(\log P)$ -approx. for shelf.

Offline/online scheduling with general dependencies [FKST'98, Li'99]:

- In this model, jobs form a known DAG $\Rightarrow \Theta(P)$ -approx. for list.
- Our model is a special online case with n linear chains, each having an unknown number of identical jobs \Rightarrow 2-approx. for list.

Q1. Results for **expected makespan** when assuming a **probability distribution** (e.g., exponential) for job failures.

- *In particular, does shelf-based scheduling admit an $O(1)$ -approx. for expected makespan under exponential failure distribution?*

Q2. Results for more **flexible job models**, such as **moldable jobs**, whose processor allocations need to be decided before execution.

- *Our latest work¹ proves approximation ratios for several speedup profiles, but bounding expected makespan remains an open question.*

¹ “Scheduling moldable jobs on failure-prone platforms”, coming soon...

Our complete paper is also available as an INRIA research report (RR9296) at:
<https://hal.inria.fr/hal-02317464v2>

Other references:

- J. Turek, J. L. Wolf, and P. S. Yu. Approximate algorithms scheduling parallelizable tasks. In ACM Symposium on Parallelism in Algorithms and Architectures (SPAA), 1992.
- E. Naroska and U. Schwiegelshohn. On an on-line scheduling problem for parallel jobs. Information Processing Letters, 81(6):297–304, 2002.
- B. Johannes. Scheduling parallel jobs to minimize the makespan. Journal of Scheduling, 9(5):433–452, 2006.
- J. L. Hurink and J. J. Paulus. Online algorithm for parallel job scheduling and strip packing. In Workshop on Approximation and Online Algorithms (WAOA), 2008
- D. Ye, X. Han, and G. Zhang. A note on online strip packing. Journal of Combinatorial Optimization, 17(4):417–423, 2009.
- A. Feldmann, M.-Y. Kao, J. Sgall, and S.-H. Teng. Optimal on-line scheduling of parallel jobs with dependencies. Journal of Combinatorial Optimization, 1(4):393–411, 1998.
- K. Li. Analysis of the list scheduling algorithm for precedence constrained parallel tasks. Journal of Combinatorial Optimization, 3(1):73– 88, 1999.