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Job Scheduling Strategies for Parallel Processing

23rd International Workshop, JSSPP 2020 New Orleans, LA, USA, May 22, 2020 Revised Selected Papers



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Preface

This volume contains the papers presented at the 23rd workshop on Job Scheduling Strategies for Parallel Processing (JSSPP 2020) that was held on May 22, 2020, in conjunction with the 34th IEEE International Parallel and Distributed Processing Symposium (IPDPS 2020). The proceedings of previous workshops are also available from Springer as LNCS volumes 949, 1162, 1291, 1459, 1659, 1911, 2221, 2537, 2862, 3277, 3834, 4376, 4942, 5798, 6253, 7698, 8429, 8828, 10353, 10773, and 11332.

This year eight papers were submitted to the workshop, of which we accepted six. All submitted papers went through a complete review process, with the full version being read and evaluated by an average of four reviewers. Additionally, one invited paper and one keynote were included in the workshop. We would like to especially thank our Program Committee members and additional reviewers for their willingness to participate in this effort and their excellent, detailed, and thoughtful reviews.

For the first time in its history the JSSPP workshop was held fully online due to the worldwide COVID-19 pandemic. Despite the obvious logistic problems, all talks were presented live, allowing for the participants to interact with the authors of the papers. We are very thankful to the presenters of accepted papers for their participation in the live workshop session. Recordings from all talks at the 2020 edition can be found at the JSSPP's YouTube channel: https://bit.ly/3mXyT8F.

This year, the workshop opened with a keynote delivered by César De Rose from the PUCRS, School of Technology, Brazil. De Rose discussed interference-aware scheduling in virtualized environments, where multiple applications contending for shared resources are susceptible to cross-application interference, thus leading to possible significant performance degradation and consequently an increase in the number of broken SLAs. Therefore, interference-aware scheduling has gained traction, with the investigation of ways to classify applications regarding their interference levels and the proposal of static cost models and policies for scheduling co-hosted applications. The keynote was concluded with a demonstration of how interference-aware scheduling can improve resource usage while reducing SLA violations, with further opportunities for improvement in the areas of application classification and pro-active dynamic scheduling strategies.

Papers accepted for this year's JSSPP focused on several interesting problems within the resource management and scheduling domains. The first two papers focused on the problem of resource contention and workload interference. Yoonsung et al. discussed the performance degradation due to the contention for shared resources, such as cache and memory bandwidth. In this paper, the trade-offs between software and hardware isolation techniques were illustrated. Also, authors showed the benefit of coordinated enforcement of multiple isolation techniques.

Thiyyakat et al. presented a new scheduling policy that improves the performance of critical workload that is co-located with less important batch workloads. The authors

showed that their policy decreases the slowdown for critical workloads compared to a solution that used standard Control Groups (cgroups).

In their invited paper, Jaroš et al. discussed the problems related to scheduling ultrasound simulation workflows. They described how therapeutic ultrasound plays an increasing role in modern medicine. To optimize its benefits, the treatment procedures must be adapted carefully to patients needs by computing various DAG-like workflows that refine the parameters needed for the actual ultrasound machine. In their paper, authors discussed several scheduling problems that must be solved in order to execute these workflows efficiently.

Cavicchioli et al. approached the problem of under-utilizing available memory bandwidth when avoiding memory interference in systems that feature high-performance multi-core CPUs tightly integrated with data-parallel accelerators. They performed a set of experiments where they showed that the standard conservative approach that relies on exclusive use of shared main memory can be extended by injecting controlled amounts of memory requests coming from other tasks than the one currently granted exclusive DRAM access, thus using the available bandwidth more efficiently.

Nobre et al. proposed a highly optimized GPU+CPU based approach for epistasis detection. Epistasis (multiple interacting variations in DNA) detection is an important research topic in the field of DNA analysis as it allows to better understand various DNA variations that may cause, e.g., Alzheimer's disease, breast cancer, or Crohn's disease. As such, epistasis detection represents a computationally intensive optimization problem.

The sixth paper focused on walltime prediction and its impact on job scheduling performance and predictability. Job walltimes estimates, usually specified by users, are known to be very imprecise which causes problems both to the users and to the scheduling policies. Klusáček et al. presented an experimental analysis that demonstrated how the use of walltime predictors impacts the actual performance of a job scheduler as well its ability to provide accurate predictions concerning future job execution.

Last but not least, Geng et al. presented PDAWL, a novel dynamic approach for scheduling tasks that are capable of running simultaneously on both CPUs and general-purpose accelerators. It uses machine learning to build communication and computation performance estimation model of the workload with respect to the actual CPU and GPU performance. The online scheduler then adaptively adjusts the workload allocation based on the runtime situation.

We hope you can join us at the next JSSPP workshop, this time in Portland, Oregon, USA, on May 21, 2021. Enjoy your reading!

September 2020

Dalibor Klusáček Walfredo Cirne Narayan Desai

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