



## Editorial

# HPS-HDS: High Performance Scheduling for Heterogeneous Distributed Systems



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## ABSTRACT

Heterogeneous Distributed Systems (HDS) are often characterized by a variety of resources that may or may not be coupled with specific platforms or environments. Such type of systems are Cluster Computing, Grid Computing, Peer-to-Peer Computing, Cloud Computing and Ubiquitous Computing all involving elements of heterogeneity, having a large variety of tools and software to manage them. As computing and data storage needs grow exponentially in HDS, increasing the size of data centers brings important diseconomies of scale. In this context, major solutions for scalability, mobility, reliability, fault tolerance and security are required to achieve high performance. More, HDS are highly dynamic in its structure, because the user requests must be respected as an agreement rule (SLA) and ensure QoS, so new algorithm for events and tasks scheduling and new methods for resource management should be designed to increase the performance of such systems. In this special issues, the accepted papers address the advance on scheduling algorithms, energy-aware models, self-organizing resource management, data-aware service allocation, Big Data management and processing, performance analysis and optimization.

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## 1. Introduction

High-performance scheduling has been traditionally approached as an NP-complete optimisation problem having execution time as the single objective of interest. The increased complexity of the currently emerging heterogeneous distributed systems aggregating parallel computers, clusters, peer-to-peer systems, or virtualized Cloud operating either in centralized data centers or distributed towards the edge of the network, bring along additional objectives of equal importance, such as energy consumption, operational costs, reliability, security, uncertainty, elasticity, just to mention few. The optimization challenge is that these objective are often in contradiction with each other, requiring new algorithms with increased complexity that converge to acceptable trade-off solutions.

The problem of task scheduling and resource allocation under SLA constraints is one of the main challenges the context of heterogeneous distributed systems, because we face with the need to satisfy the contract between service providers and clients considering that the total profit in the system depends on how the system meets different demands.

Additionally, we have a trade-off between the scope of cloud providers that is represented by the need to maximize profit and the client satisfaction. An SLA that is in place can include various parameters such as computational power, memory and/or hard disk space, network bandwidth, availability of the resources, data security, consumed power and so on. In order to meet the the agreements with clients, service providers offer and maintain a large number of resources than it is the case, or end up breaking the SLA's because they cannot meet the agreed parameters.

Thus optimizing the resource allocation process is a must in order to maximize the provider's profit and to honor the SLA. Honoring a SLA contract requires building an accurate resource allocation model which assesses the amount (and characteristics) of the needed resources. Building such a model became difficult because the amount of resources needed in order to meet such an SLA can vary significantly over time.

## 2. This special issue

This special issue called for original papers on latest research and innovations, solutions and developments on High Performance Scheduling for HDS. Authors were solicited to submit complete unpublished papers oriented on the following, but not limited to: foundational models for task scheduling and resource

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management in HDS, distributed scheduling algorithms, adaptive and machine learning based scheduling algorithms, dynamic resource provisioning, load-balancing and co-allocation, data-aware scheduling, self-\* techniques for high performance scheduling, scheduling in big data platforms, content distribution systems for large data, data-intensive computing applications, scheduling for map-reduce and Hadoop, high-throughput computing applications, cloud workload profiling and deployment control, workflow scheduling and scalability analysis, scheduling for many-task computing, cloud resource virtualization and composition, task offloading and scheduling techniques for mobile cloud computing, resource management for high performance cloud computing, scheduling for green computing, quality management and service level agreement (SLA), reliability and fault tolerance of HDS, performance evaluation.

The special issues follows the previous published work like ARMCO (advanced topics in resource management for ubiquitous cloud computing: an adaptive approach) [1], and MidHDC (advanced topics on middleware services for heterogeneous distributed computing) part 1 and part 2 [2,3].

In the first paper, a competitive analysis of fundamental scheduling algorithms on a fault-prone machine and the impact of resource augmentation is presented by Antonio Fernandez Anta et al. [4]. The main conclusion highlighted by the authors shows that all deterministic and work-conserving algorithms require speedup to be competitive.

Fredy Juarez et al., in the second paper, titled “Dynamic Energy-Aware Scheduling for Parallel Task-Based Application in Cloud Computing” [5], describe a model for for estimating the application energy consumption and propose an energy-aware run-time scheduler for task-based applications using a multi-heuristic resource allocation algorithm to get solutions in polynomial time.

In the third paper, Rodrigo da Rosa Righi et al. are proposing MigPF, a migration model for bulk-synchronous parallel programs on heterogeneous environments [6]. Based on the simple ideas from the TCP protocol, MigPF adapts the interval between migration calls. As a new contribution, the authors propose a new algorithm that self-organizes process migration.

A novel sampling method for massive data as the input of Spark framework is introduced by Zhuo Tang et al. in the 4th paper [7]. Based on this, the authors describe and algorithm for filling the settled number of buckets with roughly equal number of tuples.

Michał P. Karpowicz et al. highlights in the 5th paper the design and implementation of energy-aware application-specific CPU frequency governors for the heterogeneous distributed computing systems [8]. The authors propose a benchmarking methodology to identify models of CPU workload dynamics.

The 6th paper, authored by Wenbin Jiang et al. [9], proposes a fine-grained parallelism for intra prediction based on GPU. The authors present a new regular prediction formula for parallelism and two optimized encoding orders are adopted for multi-levels parallelism.

The 7th paper addresses the problem of Data Centres (DCs) integration into the Smart Grid scenario by proposing a technique for scheduling and optimizing their operation allowing them to participate in Smart Demand Response programs [10]. Tudor Cioara et al.

A bio-inspired coral-reefs optimization paradigm to model cloud elasticity and a game theory-based approach to identify the best cloud resource reallocation schema Fuzzy linguistic SLA formalization is considered by Massimo Ficco et al. in the 8th paper [11].

The 9th paper, authored by Lizhe Wang et al. [12], considers a Cloud-enabled HPC platform for large-scale remote sensing dataset applications. The authors propose in this paper, Hilbert-R<sup>+</sup>, a tree based data indexing for optimal remote sensing big data indexing.

They consider collaborative large-scale remote sensing workflow processing across data centers with VMs and bare-metal provisioning.

Konstantinos Douzis et al. propose a modular and generic IoT management system in the Cloud [13]. The authors developed a sensor data collection service, which separates IoT devices and cloud system with NoSQL data storage support. It supports vendor agnostic and on the fly data collection from IoT devices and fast incoming traffic (POST data around 1.7 s per event).

A resource provisioning framework for bioinformatics applications in multi-Cloud environments is presented by Izzet F. Senturk et al. in the 11th paper [14]. The proposed framework simplifies extending local resources to a multi-cloud environment. The authors show that the considered scheduling algorithm decreases the workflow execution time for a given budget.

The last paper, authored by Rong Jiang et al. [15], propose a high performance and privacy-preserving query scheme over encrypted multidimensional big metering data. In the proposed solution, encrypted metering data are stored in the server of an untrusted heterogeneous distributed system environment.

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