# **Toward High Performance Computing Education**

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#### **ABSTRACT**

High Performance Computing (HPC) is the ability to process data and perform complex calculations at extremely high speeds. Current HPC platforms can achieve calculations on the order of quadrillions of calculations per second with quintillions on the horizon. The past three decades witnessed a vast increase in the use of HPC across different scientific, engineering and business communities, for example, sequencing the genome, predicting climate changes, designing modern aerodynamics, or establishing customer preferences. Although HPC has been well incorporated into science curricula such as bioinformatics, the same cannot be said for most computing programs.

This working group will explore how HPC can make inroads into computer science education, from the undergraduate to post-graduate levels. The group will address research questions designed to investigate topics such as identifying and handling barriers that inhibit the adoption of HPC in educational environments, how to incorporate HPC into various curricula, and how HPC can be leveraged to enhance applied critical thinking and problem solving skills. Four deliverables include: (1) a catalog of core HPC educational concepts, (2) HPC curricula for contemporary computing needs,

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such as in artificial intelligence, cyberanalytics, data science and engineering, or internet of things, (3) possible infrastructures for implementing HPC coursework, and (4) HPC-related feedback to the CC2020 project.

# **CCS CONCEPTS**

Social and professional topics → Computer science education;
 Computing education;

# **KEYWORDS**

ITiCSE working group; high performance computing; HPC; highperformance computing curricula; contemporary computing education; computer science education.

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## 1 MOTIVATION

Current High Performance Computing (HPC) resources provide the ability to process data and perform complex calculations at quadrillions of calculations per second, orders of magnitude faster than ordinary high-speed computers [9]. HPC can be performed on dedicated supercomputers typically containing thousands of compute nodes working together to complete one or more tasks in parallel, or in recent years, large numbers of inexpensive commodity computers configured in parallel or distributed settings, with

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the Hadoop ecosystem representing an open-source archetype [1]. Further, "virtual" supercomputers consisting of distributed, interconnected cloud resources have also been leveraged for extremely low-cost and on-demand HPC.

The exascale era, with quintillions of calculations per second, promises to revolutionize many aspects of not just computing, but science in general [13]. As Gray noted [5], scientific discovery has moved from the empirical and theoretical paradigms through computational modeling/simulation to the fourth paradigm of data-intensive exploration, for which HPC is the keystone. Only HPC strategies [7] make it possible to have modern climate prediction, healthcare, structural designs, aerodynamic designs, management of natural resources, arts and entertainment, social interaction, just to name a few. Many people, including many computing educators, don't realize how much HPC impacts their daily lives.

More specifically, HPC is essential for today's "hot" computing areas such as Artificial Intelligence (AI), Cyberanalytics (CA), Data Science and Engineering (DSE) [12], and the Internet of Things (IoT). The symbiosis between AI and HPC is demonstrated by the HPC community's support for the anticipated AI revolution and the concomitant expectations that AI will drive improvements in HPC hardware and algorithms [4]. Baz [2] makes a strong case, with examples, for HPC in IoT while Perrin et al. [11] make a similar case for HPC in data analytics. In fact, one could argue legitimately that deep learning would not be feasible without the availability of different HPC frameworks [14]. The use of HPC and AI for Cyberanalytics has also become commonplace [8].

HPC education presents unique challenges. Almost all HPC applications implement some form of parallelism that is an inherently difficult concept to grasp. Additionally, a substantial portion of HPC education seems ad hoc, and would benefit from a more structured approach. Finally, new approaches are needed to advance the education of disciplinary specialists [7]. To progress toward these goals, the working group will investigate how HPC education can be delivered to the next generation of faculty and students.

## 2 WORKING GROUP OBJECTIVES

There have been prior efforts in bringing HPC into computing education [6, 7]. An ITiCSE 2010 working group [3] also addressed questions such as what aspects of parallelism should students learn; how these concepts and practices could be incorporated into the computing curriculum; what resources might be needed; and what systemic obstacles exist to prevent adoption. HPC has been well-incorporated into many bioinformatics and computational biology curricula [10], but not uniformly or adequately into computing programs as yet.

This working group will extend earlier work [6, 7] by addressing the following: What efforts are needed to prepare computing and other STEM researchers, educators, and practitioners to include HPC coursework as part of the curriculum? How can educators scale-up or scale-out successful HPC education approaches? What obstacles and barriers inhibit HPC acceptance and how might educators overcome them? How can HPC help to enhance applied critical thinking and problems-solving skills of computing students?

Building on the background and motivation already mentioned, this working group seeks to:

- (1) Catalog HPC elements such as multi- and many-core programming; distributed memory, shared memory, and hybrid models; accelerators including graphical processing units, FPGAs, Xeon Phi and Quantum processing units; parallel and distributed file systems, and supercomputers.
- (2) For each of the contemporary application areas (such as such as AI, DSE or IoT), catalog best practices and examples of how educators can incorporate HPC.
- (3) Explore infrastructures for implementing HPC coursework with a focus on simple and low-cost solutions.
- (4) Develop HPC recommendations for modern computing curricula and provide feedback to the CC2020 project.

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