

## REVIEW ARTICLE

# A Survey on Parallel Computing and its Applications in Data-Parallel Problems Using GPU Architectures

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**Abstract.** Parallel computing has become an important subject in the field of computer science and has proven to be critical when researching high performance solutions. The evolution of computer architectures (*multi-core* and *many-core*) towards a higher number of cores can only confirm that parallelism is the method of choice for speeding up an algorithm. In the last decade, the graphics processing unit, or GPU, has gained an important place in the field of high performance computing (HPC) because of its low cost and massive parallel processing power. Super-computing has become, for the first time, available to anyone at the price of a desktop computer. In this paper, we survey the concept of parallel computing and especially GPU computing. Achieving efficient parallel algorithms for the GPU is not a trivial task, there are several technical restrictions that must be satisfied in order to achieve the expected performance. Some of these limitations are consequences of the underlying architecture of the GPU and the theoretical models behind it. Our goal is to present a set of theoretical and technical concepts that are often required to understand the GPU and its *massive parallelism* model. In particular, we show how this new technology can help the field of *computational physics*, especially when the problem is *data-parallel*. We present four examples of computational physics problems; *n-body*, *collision detection*, *Potts model* and *cellular automata* simulations. These examples well represent the kind of problems that are suitable for GPU computing. By understanding the GPU architecture and its massive parallelism programming model, one can overcome many of the technical limitations found along the way, design better GPU-based algorithms for computational physics problems and achieve speedups that can reach up to two orders of magnitude when compared to sequential implementations.

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## 1 Introduction

For some computational problems, CPU-based algorithms are not fast enough to give a solution in a reasonable amount of time. Furthermore, these problems can become even larger, to the point that not even a *multi-core* CPU-based algorithm is fast enough. Problems such as these can be found in science and technology; natural sciences [52, 108, 116] (Physics, Biology, Chemistry), information technologies [115] (IT), geospatial information systems [11, 66] (GIS), structural mechanics problems [12] and even abstract mathematical/computer science (CS) problems [84, 98, 101, 109]. Today, many of these problems can be solved faster and more efficiently by using massive parallel processors.

The story of how massive parallel processors were born is actually one of a kind because it combines two fields that were not related at all; *computational science* and *video-game industry*. In science, there is a constant need for solving the largest problems in a reasonable amount of time. This need has led to the construction of massively parallel *super-computers* for understanding phenomena such as galaxy formation, molecular dynamics and climate change, among others. On the other hand, the video-game industry is in a constant need for achieving real-time photo-realistic graphics, with the major restriction of running their algorithms on consumer-level computer hardware. The need of realistic video-games led to the invention of the graphics accelerator, a small parallel processor that handled many graphical computations using hardware implemented functions. The two needs, combined together, have given birth to one of the most important hardware for parallel computing; the GPU.