

UNIVERSITI TEKNOLOGI MARA

**ANALYSIS OF EVOLUTIONARY
COMPUTING PERFORMANCE VIA
MAPREDUCE PARALLEL
PROCESSING ARCHITECTURE**

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ABSTRACT

Evolutionary computation (EC) is a method that is ubiquitously used to solve complex computation. Examples of EC such as Genetic Algorithm (GA) and PSO (Particle Swarm Optimization) are prevalent due to their efficiency and effectiveness. Despite these advantages, EC suffers from long execution time due to its parallel nature. Therefore, this research explores the prospect of speeding up the EC algorithms specifically GA and PSO via MapReduce (MR) parallel processing framework. MR is an emerging parallel processing framework that hides the complex parallelization processes by employing the functional abstraction of “map and reduce”. The performance of the parallelized GA via MR and PSO via MR are evaluated using an analogous case study to find out the speedup and efficiency in order to measure the scalability of both proposed algorithms. Comparisons between GA via MR and PSO via MR are also established in order to find which EC algorithm scales better via MR parallel processing framework. From the results and analysis obtained from this research, it is established that both GA and PSO can be efficiently parallelized and shows good scalability via MR parallel processing framework. The performance comparison between GA via MR and PSO via MR also shows that both algorithms are comparable in terms of speedup and efficiency.

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CHAPTER ONE

RESEARCH BACKGROUND

1.1 RESEARCH OVERVIEW

Evolutionary computing (EC) is a field of computer science that adapts the theory of Darwinian evolution to optimize computing problems (Eiben & Smith, 2003). The basis of EC revolves around the process of natural evolution such as random variation, competition, and reproduction (De Jong et al., 1997). The process of EC is widely applicable for various types of problems due to the fact that evolution itself is an optimization process (De Jong et al., 1997). Two of its most prevalent algorithms, Genetic Algorithm (GA) and Particle Swarm Optimization (PSO) have been used ubiquitously to optimize problems in numerous fields of study (Eberhart & Shi, 1998; Eiben & Smith, 2003; Settles & Soule, 2005; Premalatha & Natarajan, 2009). Despite the robustness of EC, expensive computing resources are required due to its parallel nature (Rajan & Nguyen, 2004; Massa et al., 2005; Zhu & Wang, 2010; Farmahini-Farahani et al., 2010). This indicates that EC would perform better in parallel where it can be executed simultaneously compare to that of a normal serial execution. Therefore, EC has since become a popular subject of parallelization using various parallel processing techniques and architectures (Cantú-Paz, 1998).

Parallel processing allows access to more computing resources compare to the traditional serial approach of computing. Examples of parallel processing architectures include high-end server and mainframe that are very expensive and only applicable to large company and corporations. Nevertheless, parallel processing can also be employed in a cost-effective manner. This is achieved by combining collection of commodity off-the-shelf (COTS) computing nodes to emulate a high-end-server or mainframe (Brightwell et al., 2000). Parallel processing has gained a huge ground with the emergence of various frameworks such as Message Passing Interface (MPI) (Dongarra et al., 1993) and OpenMP (Dagum & Menon, 1998). However, the frameworks are known for their complex parallelization process specifically in terms of managing and distributing the resources