## OPTIMIZATION GRID SCHEDULING WITH PRIORITY BASE AND BEES ALGORITHM

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## ABSTRAK

Pengaturcaraan grid bergantung kepada perkongsian skala besar di dalam rangkaian yang berhubung dengan sendiri seperti internet. Oleh itu, kebanyakan pengkaji dan para cendekiawan pengaturcaraan grid telah bertumpu kepada jadual tugasan yang juga dianggap sebagai isu-isu NP-Complete. Penyelidikan ini bertujuan untuk mengoptimumkan jadual awal bagi pengaturcaraan grid dengan menggunakan algaritma lebah. Algaritma moden sedia maklum dengan penyelidikan ini. Prosedur yang dicadangkan bermaksud bahawasanya algaritma yang baru dibangunkan boleh melaksanakan jadual tugasan grid sementara ia mengira keutamaan dan tarikh akhir untuk mengurangkan masa yang diperlukan untuk melengkapkan sesuatu tugasan. Purata masa menunggu bagi persekitaran grid boleh dikurangkan dan menerusi pengurangan ini, secara tak langsung dapat menghasilkan peningkatan pemprosesan persekitaran.

## Key words: grid, pengaturcaraan, mengoptimumkan, algaritma lebah, masa

## ABSTRACT

Grid computing depends upon sharing large-scales in a network that is widely connected within itself such as the Internet. Therefore, many grid computing researchers and scholars have focused on task scheduling, which is considered one of the NP-Complete issues. The main aim of this current research to propose an optimization of the initial scheduler for grid computing using the bees algorithm. Modern algorithms informed this research. The suggested procedure means that a newly developed algorithm can implement the schedule grid task while accounting for priorities and deadlines to decrease the completion time required for the tasks. The average waiting time of the grid environment can be minimized, and this minimization, in turn, creates an increase in the throughput of the environment.

#### Key words: grid, computing, optimization, bees algorithm, waiting time

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## List of Abbreviations

ACO	Ant Colony Optimization
BCO	Bee Colony Optimization
EDF	Earliest Deadline first
ERD	Earliest Release Date
FCFS	First Come First Serve
GA	Genetic Algorithm
GIS	Grid information service
GRAM	Grid Resource Allocation and Management
GS	Grid Scheduler
НАТ	Hybrid algorithm technique
HAST	Hybrid algorithm search technique
НС	Hill climbing
IT	Information Technology
LJF	Longest Job First
LM	The Launching and Monitoring
LRM	Local Resource Manager
MTTD	Minimum Time to Due Date
NP	Nondeterministic Polynomial time
OGSA	Open Grid Services Architecture
P2P	Peer-To-Peer
PBBS	Priority Based Bee Scheduling

PSO	Particle Swarm Optimization
QOS	Qualities of services
QRC	Qualifying Resource Collection
SA	Simulated annealing
SJF	Shortest Job First
TS	Taboo search
VO	Virtual Organization
WIP	Work-in-process

#### CHAPTER ONE

## INTRODUCTION

Grid computing is a type of computing that depends on sharing a large-scale network that is widely connected within itself such as in the Internet. [1] Researchers have suggested that grid and cluster computing are examples of different ways of starting a distributed system. A distributed system is way of connecting many computers in order to give them the ability to communicate within a computer network. Having multiple computers or workstations in cluster computing joined by local networks allows them to create distributed applications. Due to their limits, fixed-area applications in cluster computing are inflexible [2].This particular disadvantage has led to the suggestion that grid computing numerous resources from several geographic locations. This combination of resources from several geographic locations differentiates grid computing from cluster computing and conventional distributed computing. Different requirements and constraints exist for computation grid compared with those in traditional high performance computing systems [3].

True standardization has been developed to meet critical industrial requirements and so that grid computing technology can be enhanced. The Global Grid Forum started in 1998 as an international community and standards organization. The main responsibility of this organization was to develop different standardization activities [4]. Open Grid Services Architecture (OGSA) was established as another standard

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