

# Replication Based Job Scheduling in Grids with Security Assurance

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**Abstract**—Security assurance is a critical requirement for QoS or SLA satisfactions in risky grid environments because jobs may be scheduled to multiple machines across different distributed administrative domains. Unlike conventional methods using fixed-number job replications, in this paper, we propose a security-aware parallel and independent job scheduling algorithm based on adaptive job replications to make sure the job scheduling decision secure, reliable and fault tolerant. In risky and failure-prone grids, the replication number is changed according to the current security conditions and the end-user settings. Simulation results show that it is robust due to its adaptive job replications and rescheduling mechanism. The performance results also show that it is better than non-security-aware scheduling algorithms based on fixed-number job replications.

**Index Terms**— adaptive replication; job scheduling; grid security; fault tolerance.

## I. INTRODUCTION

In a large-scale grid [1], Job executions are usually carried out between many virtual organizations in business applications or scientific applications for faster execution or remote interaction. However, grid security is a main hurdle to make the job scheduling secure, reliable and fault tolerant. If a host in the grid is under attack or malicious usage, its resources may not be accessible from remote sites. Thus, the jobs scheduled to that host may be delayed or failed because of the system infections or crashes.

Many algorithms have been developed for scheduling jobs in grids [2-8]. Unfortunately, most of the existing proposed scheduling algorithms had ignored the grid security while scheduling jobs onto geographically distributed grid sites with a handful of exceptions [3, 9, 10]. In a real life scenario, security threats always exist and the jobs are subject to failures or delays caused by infected hardware, software vulnerability, and distrusted security policy [3].

Furthermore, the jobs scheduled to the grid sites are subject to failure easier than in a centrally controlled or locally controlled environment because of the dynamicity of grids [11]. The failure rate grows higher when the scale of the grid becomes larger. The whole application will fail due to some key tasks or sites failures. This is not acceptable for some small granularity, large scale and long running grid applications. Job replications are commonly used to provide fault tolerant scheduling in grids. However, existing job replication algorithms use a fixed-number replication [3, 4].

In this paper, we have tackled the secure job scheduling in grids by developing security-driven and fault tolerant strategies and offered a job scheduling algorithm for use under failure-prone and risky conditions. We design a security-driven and fault tolerant scheduling strategy based on adaptive job replication. We then compare the proposed algorithm with existing heuristics based on fixed-number job replications and other trust-driven algorithms. Simulation results show that security assurance performance could be achieved, if we integrate the security-driven and fault tolerant features into job scheduling algorithms in grids.

The rest of the paper is organized as follows: Section 2 presents a brief review of related work. In Section 3, we present a trust model and specify the scheduling strategies based on adaptive job replication. We present extensive simulation results and compare the relative performance and scalability of the proposed scheduling algorithm in Section 4. Finally, we summarize the contributions in Section 5.

## II. RELATED WORK

In security-driven job scheduling, the scheduling process becomes much more challenging [11,12]. Humphrey and Thompson [13] provided usage models for security-driven grid computing, such as authentication, authorization, integrity, and confidentiality. However, the implementation details of a security-driven and fault tolerant scheduler were not specified. In this paper, we focus on how to establish a security-driven and fault tolerant algorithm based on adaptive job replications and how the security-aware algorithm affects the overall performance of the user jobs in grids.

Song et al [14] developed a security-binding scheme through site reputation assessment and trust integration across grid sites. The binding is achieved by periodic exchange of site security information and matchmaking to satisfy user job demands. In this paper, we try to quantify the trustworthiness of resource sites, based on previous security performance data, such as prior success rates of job execution, cumulative site utilization, and intrinsic security attributes of resource sites.

Hwang [15] presented a generic failure detection mechanism and a flexible failure handling framework as a fault tolerant mechanism in grids. They use notification mechanism to transfer failure messages between grid sites. In this paper, our work is partially based on the above notification mechanism. We assume that there is a

server to transfer messages between grid sites when jobs failed or successfully completed.

We derive security-aware parallel and independent job scheduling algorithm based on adaptive job replication for risky and failure-prone grid environment. The security-driven algorithm hereby developed can be applied to modify many other existing heuristics or sufferage algorithms.

### III. TRUST MODEL AND ADAPTIVE JOB REPLICATION

In this paper, we assume that the estimates of expected task execution times on each machine in the grid sites are known. Approaches for doing this estimation include intrinsic and extrinsic factors method [16], analytic benchmarking [17], etc. We also assume that the system components may fail and can be eventually recovered from failures. Both hardware and software failures obey the fail-stop [18] failure mode.

Let  $M$  denote hosts set,  $M = \{m_j | j=1,2,3,\dots,m\}$ ,  $T$  denote tasks set,  $T = \{t_i | i=1,2,3,\dots,n\}$ . We define the following parameters :

(1)  $SD_i$  : The security demand of task  $t_i$ .  $SD_i$  is specified when the task is submitted, and  $SD_i$  is a real fraction in the range  $[0, 1]$  with 0 representing the lowest and 1 the highest security requirement. In some grid environments, setting  $SD_i$  equal to 1 is unnecessary although it seems to be risk-free. If  $SD_i$  is always equal to 1, maybe there are no sites could satisfy the security demand. For example, in a volunteer grid environment such as SETI@Home[19], the security demand of jobs may be lower than a computation-intensive and real-time scientific grid, or e-commerce environment, in order to earn volunteer computing power as more as possible.

(2)  $TL_j$  : The trust level of host  $m_j$ .  $TL_j$  is in the same range  $[0, 1]$  with 0 for the most risky resource site and 1 for a risk-free or fully trusted site.  $TL_j$  is the aggregation of historical security performance data of the grid sites, such as prior success rates of job execution, cumulative site utilization, and intrinsic security attributes [3].

(3)  $\overline{TL}$  : The trust level of the grid environment.  $\overline{TL}$  is in the range  $[0, 1]$  with 0 for the most risky and 1 for a risk-free or fully trusted grid environment.  $TL_j$  is updated periodically with the site operations. This can be achieved by using some network services like NWS (Network Weather Service) [20] and MDS (Monitoring and Discovery System) [21] when scheduling.

$TL_j$  is computed as following:

$$TL_j = \alpha \times e^{-TB_j} + \beta \times rs_j + \gamma \times ru_j \quad (1)$$

Where:

$TB_j$  : denotes the time interval from the last successful task execution on host  $m_j$ ,  $TB_j > 0$  ;

$rs_j$  : denotes the accumulative success rate of job executions on host  $m_j$ ,  $0 < rs_j < 1$  ;

$ru_j$  : denotes the accumulative utilization rate of host  $m_j$ ,  $0 < ru_j < 1$  ;

$\alpha$ ,  $\beta$ ,  $\gamma$  are weighted factors of time interval, success rate of job executions and utilization rate respectively.  $\alpha$ ,  $\beta$ ,  $\gamma$  are in the same range  $(0,1)$  with  $\alpha + \beta + \gamma = 1$ .  $\alpha$ ,  $\beta$ , and  $\gamma$  change dynamically according to the historical performance data of the sites.  $\overline{TL}$  is computed as following:

$$\overline{TL} = \frac{\sum_{j=1}^m TL_j \times P_j}{\sum_{j=1}^m P_j} \quad (2)$$

We assume that there is a server which collects both  $SD_i$  and  $TL_j$ . Then  $\overline{TL}$  can be computed by the scheduler through equation 1 and equation 2. In a real grid,  $\overline{TL}$  can also be maintained by services like MDS [21].

### IV. Simulation Results and Performance Analysis

We use simulations to study the performance of the security-driven and fault tolerant scheduling algorithm based on adaptive job replication. To evaluate the self-adaptive job replication scheduling algorithm, we use the following metrics:

- Makespan: the total running time of all jobs;
- Scheduling success rate: the percentage of jobs successfully completed in the system;
- Grid utilization: defined by the percentage of processing power allocated to user jobs out of total processing power available over all grid sites;
- Average waiting time: the average waiting time spent by a job in the grid.

#### A. Simulation Results

We first test the performance of our algorithm, named SDFTS, based on SimGrid [23] package.

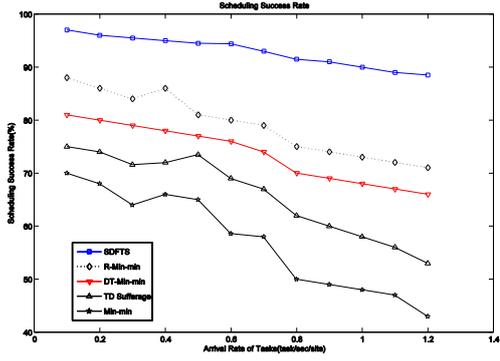
We compare the relative performance such as makespan, scheduling success rate, grid utilization and average waiting time. The simulation results are shown in Fig.1 and Fig.2. All the data in the figures are mean values of 15 simulation results, the waiting factor in DT-Min-min heuristics is 0.2, and the number of replication in R-Min-min is 2 for all simulations.

#### B. Performance Comparison

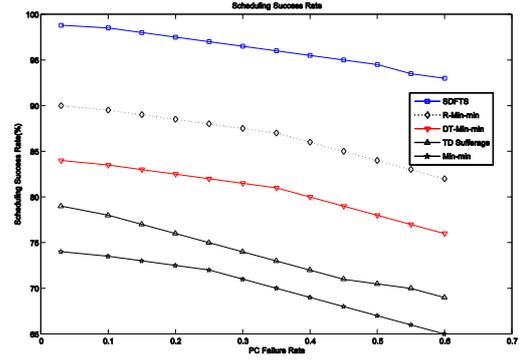
In Fig.1(a), SDFTS has the highest scheduling success rate and scales well when the number of tasks increases. It is due to the adaptive replication execution in a failure-prone grid environment.

In Fig.1(b), scheduling success rate increases when the number of hosts increases and scales well for all five algorithms. The reason is that there are more available hosts when the number of hosts increases. SDFTS also has the highest scheduling success rate because of its security-driven feature and adaptive replication execution.

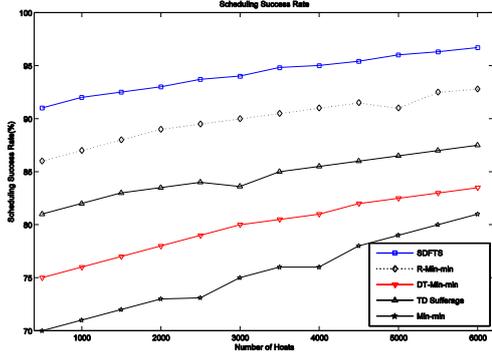
In Fig.1(c), the makespan increases when the task-host ratio increases for all algorithms. This is because that there becomes hosts-racing problem when the task to host ratio increases. The hosts-racing problem makes the tasks be executed later. However, the makespan of



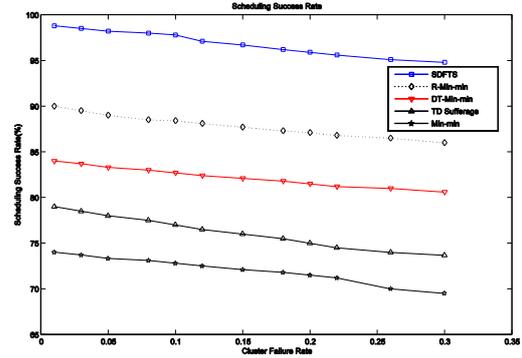
1(a)



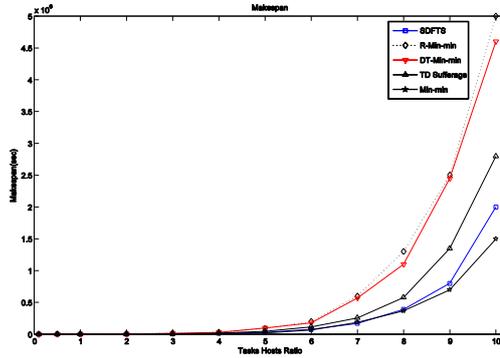
2(a)



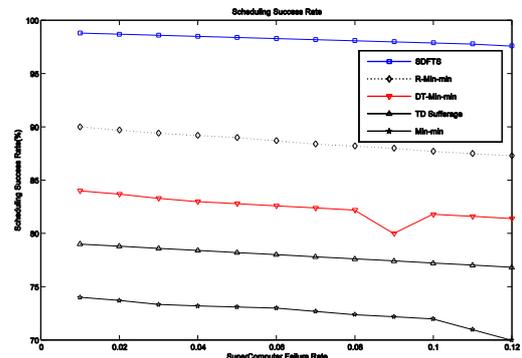
1(b)



2(b)



1(c)



2(c)

Figure. 1 comparison of scalability

Figure.2 comparison of fault tolerance

SDFTS doesn't increase dramatically when task-host ratio increases.

The results in Fig.1 show that the SDFTS algorithm has relative higher scalability than others.

The results in Fig.2 show that the scheduling success rate decreases slightly when hosts failure rate increases and SDFTS has the highest scheduling success rate than others. Consequently, SDFTS has the best fault tolerance performance. We also observe from Fig.2 that the scheduling success rate decreases more slightly when supercomputer failure rate increases than that of PCs and clusters. This is because that in our simulations the occupation frequency of supercomputer is rather small. Thus, the curve in Fig.2(c) is milder than the other two in Fig.2.

In summary, SDFTS changes the number of replications dynamically according to the dynamicity of the grid security level. Thus SDFTS is applicable to the

grid where the trust level changes frequently and can reduce the number of total job replications. SDFTS reschedules the failed tasks in a failure-prone grid environment which makes the scheduling robust and higher success rate on cost of slightly longer makespan. Moreover, SDFTS scales well in a large grid and it is applicable to security-driven and fault-tolerant scheduling.

## V. CONCLUSIONS

We have studied scheduling strategies that are of use when minimizing job failures and improving reliability and fault tolerance in grid environments. In our simulations, the average successful job scheduling rate is 97%, and average grid utilization is 74%. It is clear that profound changes in system performance, robustness, reliability and scalability can be achieved by security-driven and fault tolerant scheduling algorithm based on

adaptive job replications. In addition, the current grid is risky and failure-prone and very few scheduling algorithms are being constructed from a security and fault tolerant perspective.

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