

## Research on an Improved Grid Task Scheduling Model Algorithm

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### **Abstract**

*On the basis of analyzing the current status and the key technology of grid workflow scheduling, deep research on grid workflow scheduling algorithm under the restraint of time QOS and trust QOS is done in the paper. A grid workflow task scheduling algorithm (GWTS) based on critical tasks under the constraints of trust is designed. Firstly, backward depth of tasks is calculated in GWTS, and critical tasks are ascertained according to execution time on candidate resource. And secondly, the trust of grid resource is computed based on direct experience and recommendation experience synthetically. Finally, tasks are scheduled by decreasing backward depth and resources are closed to meet integrated function of execution time and trust and allocated for critical tasks as a priority. Experiments show that the workflow completion time is reduced and the success rate of task execution is increased by 6-15% and the GWTS algorithm can effectively guarantee grid scheduling resource optimization and improve the scheduling efficiency.*

**Keywords:** *Grid, workflow scheduling, Trust QOS*

### **1. Introduction**

In grid computing, task management, task scheduling and resource management are three necessary basic functions of grid. Effective job scheduling of workflow is a key and also a complete issue to grid system [1-6]. Due to the dynamism and autonomy of grid, plentiful unreliable resources exist in grid environment. How to choose proper resources to meet user demand is a significant and complicated job and thus the scheduling of dependable resources becomes of very importance [7-10].

Grid workflow is an important part in the grid computing environment [11-13]. So far it's mainly applied in scientific research field. Workflow task scheduling not only distributes relative sub tasks to suitable grid resources but also considers dependence relation between different tasks and the execution sequence of them among different resources. As the limited degree of grid workflow ending time is varied, workflow task is divided into two types [14-16]. For the workflow with highly restricted time range, it should ensure that the whole workflow completes in certain deadline. During the scheduling of workflow tasks, the completion time of key tasks determines the operational time of the entire workflow. If it needs reduce time of workflow, key jobs should be preferentially scheduled [17-18].

Grid dynamism and self-governing allows lots of unreliable resources in the grid system. Selecting appropriate resources to complete task scheduling becomes a complex and important job. If key jobs in the workflow are allocated to unreliable resources, it would lead to rescheduling; as a consequence [19-21], it would give rise to extra expenditures, waste of system resources and worse scheduling efficiency, along with unnecessary loss. Under this circumstance, it's rather important to introduce trust to the study on grid scheduling mechanism [22-26].

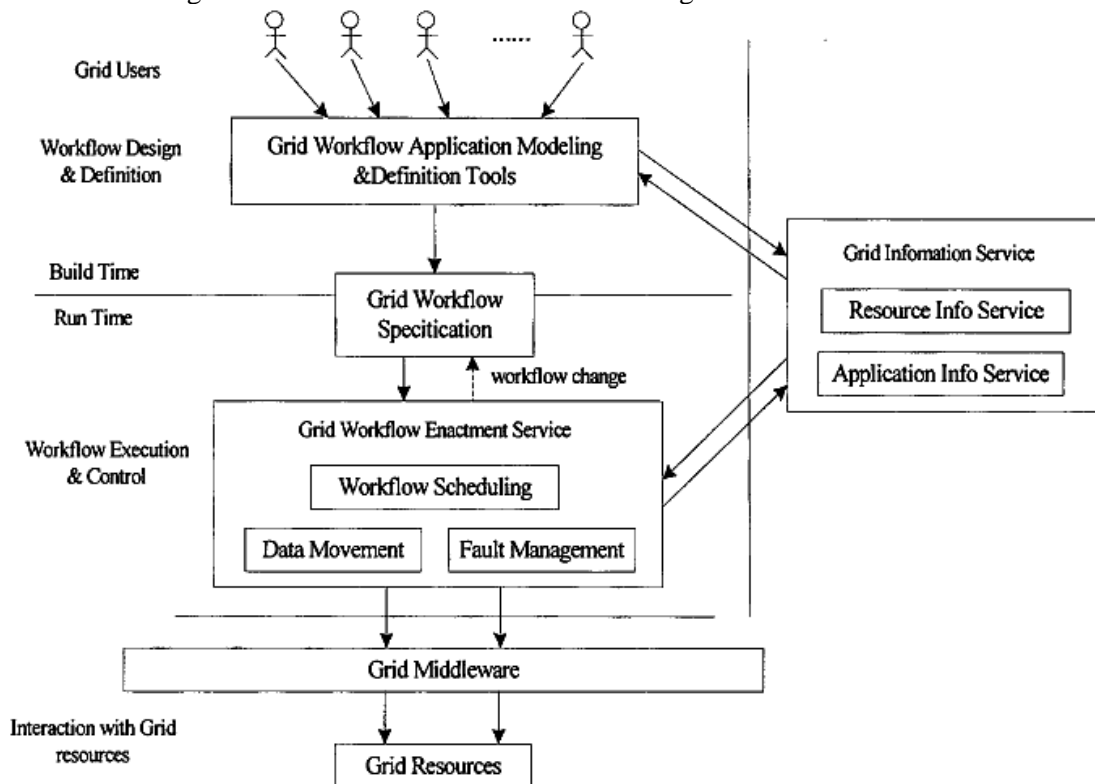
To solve problem as above, the paper proposes grid workflow task scheduling algorithm based on trust constraint. The algorithm firstly determines the reverse depth of task as to decide the execution order of workflow by processor; then, with reference to trust degree of resource and time of the sub task executed on the resource, it decides resources firstly for key tasks; next, allocate resources to non-key tasks.

## 2. Grid Workflow

Workflow is a kind of operating process which can carry out totally or partially automatically. With a series of rules followed, document, task or information can be passed and executed among different executors, making the process work automatically and collaboratively as to improve working efficiency [27-28]. The concept of grid workflow was raised on the foundation of business workflow, an automatic execution process of grid task. Workflow management system can wholly define administrative workflow and implement workflow in proper order according to the workflow logic predefined in the computer. Again we say grid workflow is an automatic execution process of grid task.

### 2.1 Architecture and Execution of Grid Workflow

The main functions of grid workflow management system are divided into two stages. Firstly, it is to define the workflow task and to model the workflow. Secondly, the workflow application is processed, including the implementation of the management workflow and the grid resource interaction. It is shown in Figure 1.



**Figure 1. Grid Workflow Management System**

The basic process of grid workflow execution includes

- (1)End - grid users submit service requests and related requirements.

(2) Grid workflow engine, workflow system uses the appropriate grid workflow description language to convert the service request into metadata.

(3) To decompose the service request from top to bottom, define the task, including the function of the task, the input and output, and generated related data files.

(4) According to the data file select service components, forms logical workflow

(5) According to the current environment and task requirements, to select the appropriate resources for the task, to determine the order of the task.

(6) Perform a task, and pass the final result or data to the user.

## 2.2 Task type of Workflow

According to the definition of Workflow Management Coalition WMFC, the execution structure of workflow task is mainly composed of the following basic types

### 1 Order relation

Task  $v_1, v_2, v_3$   $V_1, V_2$  followed by sequential execution. When the task  $v_1$  to perform after the execution of the task  $v_2$ . It is shown in Figure2 (a).

### 2 Parallel relation

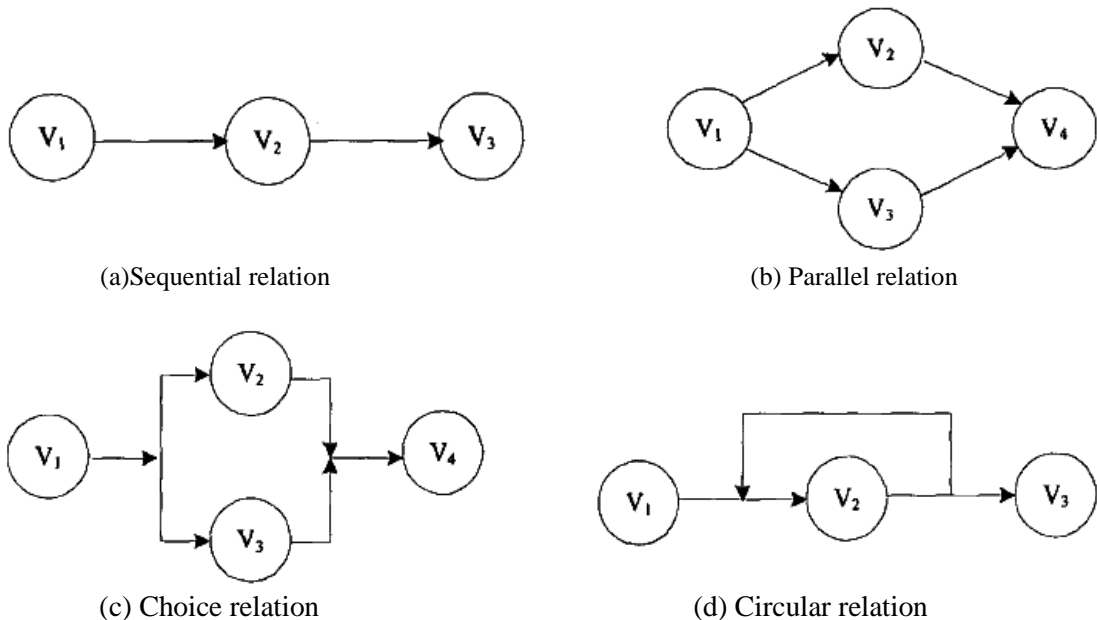
Task  $v_2$  and  $v_3$  parallel execution. That is, these two tasks can be executed simultaneously or in any order. It is shown in Figure2 (b).

### 3 Choice relation

When the task  $v_1$  is executed, the task is to select one of  $v_2$  and  $v_3$  to perform the task. It is shown in Figure2 (c).

### 4 Cyclic relation

Indicates that a task is executed several times, and the task  $v_2$  in Figure 4 can be executed once or more times. It is shown in Figure2 (d).



**Figure 2. Four Kinds of Execution Structure of Workflow**

### 3. Description of Problem

#### 3.1. Task Model

Workflow task TG is expressed with V, E, W, C; where V is collection of task nodes  $v_j$ ; E is collection of relationship between tasks;  $e_{ij}$  is dependence relation between  $v_i$  and  $v_j$ ;  $v_i$  is precursor of  $v_j$ ;  $v_i \in pre(v_j)$ ,  $succ(v_i)$  means precursor's task collection of  $v_i$ ;  $v_j \in succ(v_i)$  means task  $v_i$ 's subsequent task collection; W is collection task computing expense; weight  $w_j$  is computing expense of task  $v_j$ ; C is collection of communication time;  $c_{ij}$  is time for data transferring from task  $v_i$  to task  $v_j$ ; when  $v_i$  and  $v_j$  are at the same resource node,  $c_{ij}=0$ .

Entry task  $V_{entry}$  means task with no precursor; exit task  $V_{exit}$  means task with no successor [29].

Here we discuss only tasks of computation-intensive type. For them the communication time is calculated little, which can be neglected.

#### 3.2. Resource Model

The distributed heterogeneous resources in grid environment such as processor's computing resource, storer's memory resource belong to different grid nodes, for which management strategies are diversified, however standard and uniform interface is provide. Resources in the grid environment include the collection of different static attributes and dynamic attributes. Static attributes like CPU, number of processor, geographical position of resource, memory size, memory capacity and network bandwidth etc; dynamic attributes like available number of processing units, current CPU loading, available memory and current storage space [30].

Suppose grid contains resource nodes  $m_1, m_2, \dots, m_z$  of z grids. Each node  $m_i$  includes computing resource, storage resource etc. One resource performs higher indicating that its execution time on the resource becomes shorter, otherwise, the execution time is longer. GR is collection of grid resource node  $m_i$ .

#### 3.3. Scheduling Principle

Grid scheduling distributes tasks to the most suitable resource nodes for execution by certain strategies in the case of meeting QOS such as time and trust constraints. Grid workflow scheduling considers not only task's dependence relationship and also resourceful reliability. The proposed grid workflow task scheduling algorithm based on trust restriction has principles as follows:

##### 1 Subtask priority principle

Owing to the time sequence dependence relationship between subtasks, its scheduling and execution will affect the completion of following tasks. Non-branch tasks have little effect on execution of subsequent tasks. Even if it delays some time, there won't have impacts on the execution of the whole grid workflow.

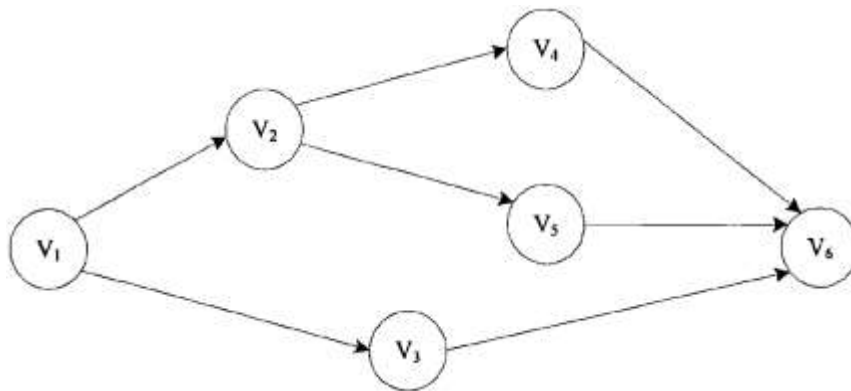
After the completion of the sub task  $v_1$ , due to the branch  $v_2$  will affect the  $v_4, v_5$  task and scheduling, so give priority to the allocation of resources for the  $v_2$ , and then for the task  $v_3$  allocation of resources, so that it can improve the task  $v_3, v_4, v_5$  execution parallelism, shorten the scheduling time. In the specific scheduling algorithm, the inverse

depth of the task is reflected by the reverse depth, the greater the reverse depth, the more tasks to participate in the branch, the priority in scheduling. It is shown in Figure3.

## 2 Key path minimization principles

Key path is the workflow path with biggest time consumption in the grid workflow task chart, i.e. from workflow entry task to exit task, the biggest path of summed task computing expense and communication cost is named CP (Critical Path). Task on key path is called key task. The execution time of task on key path plays a decisive role in the scheduling time of the entire grid workflow. To shorten completion time of the whole application, it requires possibly reducing execution time of key path which is the best and consumes the most.

We take Figure 3 for instance. From task  $v_2$  to  $v_6$ , there are two paths. Assume  $v_4$ 's execution time is far less than  $v_5$ . There are two candidate resources  $m_1$  and  $m_2$  which have different performance, where  $m_1$ 's performance is higher than  $m_2$ . To minimize  $v_5$ 's execution time, dispatching resource  $m_1$  to execute  $v_5$  and  $m_2$  to execute  $v_4$  takes shorter time than  $m_1$  matching  $v_4$  and  $m_2$  matching  $v_5$ , obviously the scheduling efficiency increased.



**Figure 3. Grid Workflow Application Example**

## 3 Reliable resource prior scheduling principle

If key path is scheduled to resource with better performance but lower trust, grid task may not be timely executed as a result of resource failure or dynamic quit of resource, thus causing re-scheduling, extending scheduling time of key task and raising workflow completion time. In this, it's necessary to choose the resource which has the highest comprehensive beneficial function of execution time and credibility for scheduling.

## 4 Minimum time and load balancing principle of sequential task

In the premise of meeting grid workflow task QOS requirement, choose for key task the resource which has the best performance and trust for treatment; while for non-key task, choose dependable idle resource to enhance system resource utilization and achieve load balancing.

#### 4. Grid Workflow Task Scheduling Algorithm

At present, there are many workflow task scheduling algorithms based on grid system. MCP and DLS are list scheduling methods in the isomorphic computing environment; HEFT and CPOP are list scheduling methods based on the earliest completion time and key path in isomeric computing environment. Those techniques consider merely task's time QOS, no account of uncertainties, fraudulence of resource nodes, unable to cater to user's service quality requirements in scheduling length and resource confidence. Hence the paper proposed grid workflow task scheduling algorithm, GWTS in short. The main idea of this algorithm is scheduling workflow task from big to small based on task's inverse depth to conform to task dependence relationship and distribute to task the resource which suffices comprehensive function of completion time and trust till all tasks fulfill resource allocation.

The algorithm is investigated on the basis of following grid environment and prerequisites:

- (1) GR Description of resource model being met; each resource is mutually connected and can inter-communicate;
- (2) Schedule the workflow task of computation-intensive type; describe formally workflow task being met and assume task computing time is greatly bigger than communication time; so communication time is ignored;
- (3) Only when precursor task is completely finished and relative program data transferring is over, can the following task start;
- (4) One node at one moment can execute one subtask; grid resource is not reliable, may get invalid; resource trust being higher suggests failure rate is lower.

Step 1: for the application of one workflow, from exit task  $V_{exit}$  to entry task  $V_{entry}$ , calculate inverse depth of each task; the specific calculation method is defined like 2:

Definition 1: task forward depth  $TD(j)$  means the biggest path length from entry task  $V_{entry}$  to task  $v_j$ .

$$TD(j) = \begin{cases} 0, & \text{if } (v_j \in V_{entry}) \\ \max_{v_i \in pre(v_j)} \{TD(i)\} + 1, & \text{otherwise} \end{cases} \quad (1)$$

Definition 2: task backward depth  $BD(i)$  means the biggest path length from task  $v_i$  to exit task  $V_{exit}$ .

$$BD(i) = \begin{cases} 0, & \text{if } (v_i \in V_{exit}) \\ \max_{v_j \in succ(v_i)} \{BD(j)\} + 1, & \text{otherwise} \end{cases} \quad (2)$$

The task depth of grid workflow instance in Figure 3 is shown in table 1.

**Table 1. Calculation Results of Two Kinds of Hierarchical Lists in an Example**

TD	Top Level	BD	Bottom Level
0	$v_1$	3	$v_1$
1	$v_2, v_3$	4	$v_2$
2	$v_4, v_5$	1	$v_3, v_4, v_5$
3	$v_6$	0	$v_6$

Step 2: use formula 3 to calculate the average execution time on according candidate resource for each workflow subtask; according to definition and computing method in

equation 5, find out the task on the path with the longest completion time from entry node to exit node; decide key task, i.e. CT.

Definition 3: task execution time is consumed by task  $t_j$  for relative candidate resource  $m_k$  in the process from starting to ending, expressed by  $t_{kj}$ ; execution time is related with the resource type and performance, which can be predicted before scheduling and is known; if resource doesn't have problem or becomes ineffective, the execution time is relatively fixed.

Definition 4: task average execution time  $\bar{t}_j$  is the mean value of execution time  $t_{kj}$  by task in candidate resource collection. It is shown in the formula 3.

$$\bar{t}_j = \frac{\sum t_{jk}}{N(qi)} \quad (3)$$

Definition 5: resource earliest available time  $avail[m_k]$  is the earliest idle usable time by resource  $m_k$  for scheduling task to the resource, which is also the earliest time for submitting task when or certain time before local task is done.

Definition 6: task beginning time  $est(v_j)$  is the earliest starting time of task  $v_j$  on processing machine  $m_k$ ; the time is the biggest value of summation of the earliest available time  $avail[m_k]$  of task's node and completion time and communication time  $c_{ij}$  of precursor task.

$$est(v_j) = \max\{avail[m_k], \max_{v_i \in pre(v_j)} (etc(v_i) + c_{ij})\} \quad (4)$$

Definition 7: task completion time  $est(v_j)$  refers to the sum of task starting time  $est(v_j)$  and task's execution time  $t_{kj}$  on resource. Comprehensive formula 4 and 5 can get the formula 6.

$$est(v_j) = est(v_j) + t_{kj} \quad (5)$$

$$est(v_j) = \max\{avail[m_k], \max_{v_i \in pre(v_j)} (etc(v_i) + c_{ij})\} + est(v_j) = est(v_j) + t_{kj} \quad (6)$$

Step 3: compute resource credibility: resource credibility includes direct confidence and recommendation confidence; direct confidence is associated with resource successful execution times, failure times, delay times and time decaying function, which is calculated as formula 5; recommendation confidence, the direct confidence of recommendation resource itself as well as recommendation factor are connected with time decaying function, which is acquired by formula 6; make direct confidence impact factor  $\alpha$  mean the weight taken up by the direct confidence degree; generally speaking, the influence of direct trust degree is biggest than recommendation confidence. In different grid environments,  $\alpha$  varies along.

$$\Omega(m, t, c) = \alpha * D(m_j, t, c) + (1 - \alpha) * R(m_j, t, c) \quad (7)$$

Step 4: according to task backward depth from big to small, distribute firstly key task, with task execution time and resource credibility as comprehensive beneficial function to allocate resources for all workflow tasks.

Here it discusses primarily computing-intensive task, whose communication time is less than computing time and thus can be neglected.

The objective of scheduling in the paper is to choose  $\min(f(v_j))$  resource by using time and trust as target function  $f(v_j)$  calculated in the expression as shown in 9.  $\lambda$  means the weight of task scheduling; the bigger the  $\lambda$  is, the greater influence the trust

has on task scheduling;  $trs_j$  is loss caused by the trust, which is acquired by formula 8;  $\{1-\Omega(m_j, t, c)\}$  represents the risk probability of resource; bigger trust value means  $\{1-\Omega(m_j, t, c)\}$  is smaller, implying that failure has less impact on task scheduling. GWTS algorithm firstly selects for key task the resource which has minimum comprehensive function of execution time and trust; then according to the scale of task  $BD(j)$  from big to small, selects for non-key task the resource which has minimum comprehensive function of completion time and trust.

$$trs_j = t_{jk} * \{1 - \Omega(m_j, t, c)\} \quad (8)$$

$$f(v_j) = \begin{cases} \lambda * trs_j + (1 - \lambda) * t_{jk}, & \text{if } (v_j \in CT) \\ \lambda * trs_j + (1 - \lambda) * ect(v_j), & \text{if } (v_j \notin CT) \end{cases} \quad (9)$$

To sum up, the grid workflow task scheduling algorithm based on critical path under trust constraints is as follows:

**Algorithm: Scheduling task on resource using GWTS**

Input: TG, GR  
 Output: allocated  $m_n$  for each task  $v_j$   
 Begin

1. For each task  $v_j$  from  $V_{entry}$  to  $V_{exit}$  in TG
2. Calculate TD(j) using(1)
3. End for
4. For each resource  $m_j$
5. Calculate  $\Omega(m_j)$  using(7)
6. End for
7. From  $V_{entry}$  to  $V_{exit}$  in TG
8. Calculate  $ect(v_j)$  for each task using(2)
9. Find CP according to  $ect(v_{exit})$  and add tasks to CT
10. Rank task according to TD(j)
11. While there is task not allocated
12. Select  $v_j$  which has the minimum TD(j)
13. Calculate  $trs_j$  using(9) for each resource in Q(j)
14. Calculate  $f(v_j)$  using(10)
15. Select  $m_n$  for task  $v_j$  having min  $f(v_j)$
16. End while
17. End

## 5. Experiment Design and Discussion

### 5.1. Grid Simulation Tool

Currently, the commonly used grid simulator mainly has SimGrid, GridSim, MicroGrid, Bricks and other simulation tools.

#### 1 SimGrid

SimGrid is the research and development of Santiago grid research and Innovation Laboratory of California University in the United States. The distributed parallel



scheduling is mainly provided with suitable models and abstractions, and accurate simulation results are provided. SimGrid includes two versions, one is SG, suitable for simulation based on DAG centralized scheduling, to provide the underlying API to build simulation environment. The other is MSG, based on SG, which provides the application oriented API, which is suitable for simulating the scheduling of multiple independent tasks.

## 2 GridSim

Gridsim is a Java based grid simulation tool developed by Melbourne University in Australia, Rajkumar, in order to achieve resource allocation of computational economy model.

It provides rich library functions as well as different parameter configurations for heterogeneous distribution of grid entities, such as resources, applications, user, scheduler and user agent etc.

GridSim can simulate the global computing, network resources, provide tasks to find, the task of virtual processing and other functions. GridSim uses a layered approach to simulate grid task scheduling, focusing on one aspect of the function of each layer.

GridSim tools include multiple entities, such as grid resources, network, information services, and the simulate these entities with the aid of the interface provided by SimJava, communicate by sending and receiving event objects to simulate the interaction behavior of grid bottom layer

This layer includes two layer Gridlet and GridSimRandom grid system model, using the model to achieve scheduler model, grid system. The upper layer is the application layer, which mainly includes the different application scenarios, including the establishment of the simulation experiment, the establishment of the user model and so on.

Resource entities are mainly composed of GridResource and a series of auxiliary classes in the GridSim toolkit. Now, contains many distributed and heterogeneous resources.

The heterogeneity of resources is mainly reflected in the processing speed, the number of processors, the processing cost, the number of machines, the local load parameters, the internal scheduling strategy and so on.

Different parameters can be established SMP, PC, cluster, and other different resource models. The layer also includes behavior of different entities. Such as task submission, resource registration, resource query, task processing, etc.

Service mainly provide to resource registration and resource query function, through the GridInformationService class to achieve. Network entities's the input class and output class to achieve, the main simulations data transmission and delay in the network.

## 3 MicroGrid

MicroGrid is the leading development of California University Santiago parallel system architecture group. By using the existing physical resources to simulate the virtual grid environment. The important part of MicroGrid is the simulation engine, which is built on the basis of the parallel distributed simulation engine. By implementing completely controllable virtual grid environment, it can help us to do the grid system design and performance evaluation of the grid system.

## 4 GridNet

GridNet is mainly to simulate the dynamic data replication strategies in data grid. GridNet replica decision based on cost estimation model is proposed.

GridNet is based on the modular design. GridNet simulation environment mainly includes the following three types of nodes, clients, servers and cache nodes. The client is responsible for generating the data access request. The server side represents the storage node. The cache node represents an intermediate storage node, which is used to copy the data stored on the server.

## 5 Bricks

Bricks is the research and development of Tokyo Institute of Science in Japan. The main simulation provides remote access to the scientific computing library and client server type of computing system. Bricks is composed of a wide area computing environment and a scheduling unit, which can be used to test various scheduling algorithms. However, centralized global scheduling has certain limitations.

Here Gridsim tool is utilized to construct simulation environment; next the proposed GWTS algorithm is compared with HEFT algorithm and CPOP.

### 5.2 Introduction of related algorithms

1 HEFT algorithm [31] is classical scheduling algorithm in heterogeneous environment; it divides scheduling process into two phases: weight distribution and task allocation. At first, as per task's execution time and dependence relationship, from entry task to exit task, assign different weights to task; then in the other phase, according to task weight from small to big, allocate task to the node of resource with the earliest ending time;

2 CPOP algorithm [32] considers preemptively key task; assign different weights in accordance to the length from task to exit and entry task; later in task allocation period, do from entry task; take priority to task on key path; assign key task to the node of resource with the shortest execution time; if it's non-key task, distribute task to the node of resource with the earliest ending time.

### 5.3 Experimental Environment Configuration

The experiment uses GridSim packet as foundation to create grid simulation environment [33], a heterogeneous multi-cluster grid system model. The model contains ten resource sites (CE\_1-CE\_10). The configuration of each resource site is listed in details in Table 2. The experimental environment generates randomly workflow which contains different subtasks.

**Table 2. Grid System Model Configuration of Simulation Experiment**

Resource name	Number of CPU systems	MIPS
CE_1	128	450
CE_2	64	300
CE_3	256	410
CE_4	64	340
CE_5	512	230
CE_6	256	420
CE_7	128	230
CE_8	128	340
CE_9	64	450
CE_10	256	300

The resources attribute increases the reliability level (R,N,U,M) and the delay and failure rate of the reliability level are shown in Table 3. The performance of the resource is not stable, and the failure probability of the resource is expressed as the failure

probability of the resources, which reflects the possibility of the unilateral revocation of the resource.

**Table 3. Reliability Level of Resources**

Reliability level	Delay rate	failure rate
Reliabel(R)	[0,5]	[0.01,0.1]
Normal(N)	[5,20]	[0.1,1]
Unreliable(U)	[20,50]	[1,10]
Malicious(M)	[50,100]	[10,100]

The influence of direct trust and recommendation trust is equivalent in the initial time, so the confidence factor of formula 7 is  $\alpha = 5$ . According to the reliability level defined in table2, the experiment sets 2 resource scene, it is shown in table 4.

**Table 4. Scene Distribution of Reliable Resources and Non reliable Resources**

Scenario	R	N	U	M
SC1(Reliable)	85%	7%	5%	3%
SC2(Unreliable)	40%	30%	20%	10%

Two indicators are used to evaluate the performance of the algorithm.

(1) MakeSpan

Span means time span from task beginning to resource execution till all tasks complete; the shorter time the completion takes, the better performance the algorithm can achieve and the better performance the grid system can get.

(2) Task execution success rate

Workflow execution success rate analyzes the effect of trust QOS on task scheduling, S means the number of successful scheduling; n is total number of scheduled tasks. Calculation method is shown in formula 10.

$$suc\_rate = \frac{\sum_{i=1}^m s}{n} \quad (10)$$

**5.4 Experimental Result Analysis**

Here a simulation program is compiled to GRIDSIM tool, which includes relative resource description, task description and relevant scheduling algorithm. The experiment sets SC1 and SC2 scenes. Adjust the influence of trust on the scheduling according to different value of  $\lambda$ , which is experimentally implemented as below:

- (1) In SC1, when  $\lambda = 0.5$ , Schedule contains 20,50,100,200,500 workflow tasks, the completion time of the different algorithm is shown in Table 5.

**Table 5. The Completion Time of the Task of  $\lambda = 0.5$  in SC1**

Task number	HEFT	CPOP	GWTS
20	170	160	158
50	420	420	400
100	670	680	631
200	1567	1459	1412
500	2644	2645	2356

- (2) In SC2,when  $\lambda = 0.9$  Scheduling different workflow tasks. The completion time of the algorithm is shown in Table 6.

**Table 6. The Completion Time of the Task of  $\lambda = 0.9$  in SC2**

Task number	HEFT	CPOP	GWTS
20	233	190	160
50	520	500	456
100	850	812	617
200	1756	1765	1570
500	3200	3250	2611

(3) In SC2, when  $\lambda = 0.9$  Scheduling different workflow tasks. The success rate of workflow execution is shown in Table 7 and in Figure 4.

**Table 7. Success Rate of Workflow Execution of  $\lambda = 0.9$  in SC2**

Task number	HEFT	CPOP	GWTS
20	61	63	66
50	63	67	73
100	70	69	79
200	72	74	80
500	75	80	89

The major shortcoming of HEFT algorithm is inability to reduce scheduled MAKESPAN during each scheduling, because the ready task with the earliest and minimum starting time is not necessarily key task, and task preferentially scheduled to processing resource node would take its own time, as a result key task can't get firstly the resource node with faster processing speed when resource is selected, making MAKESPAN of the whole workflow grow. But HEFT algorithm and CPOP algorithm don't take into account the trustability of resource. The proposed GWTS algorithm made improvements of the two methods, by merging the influence of QOS trust and QOS time on scheduling.

If tasks on key path are distributed to the resource which has the shortest execution time and worst confidence degree, it would lead to re-scheduling due for resource failure. If at this moment tasks are assigned to other candidate resources, key task needs waiting, extending the completion time of the whole workflow. GWTS algorithm considers task's average execution time on each candidate resource when deciding key path. Also by integrating resource trust and execution time, it distributed resource preferentially for key task, shortening the execution time of workflow. Table 7 reveals that the proposed GWTS algorithm considered resource credibility on key path and increased task execution successful rate. More tasks indicates GWTS algorithm gains higher task execution success rate. Through adjustment of the proportion of trust as per the value of  $\lambda$ , the influence of trust on scheduling is well assured.

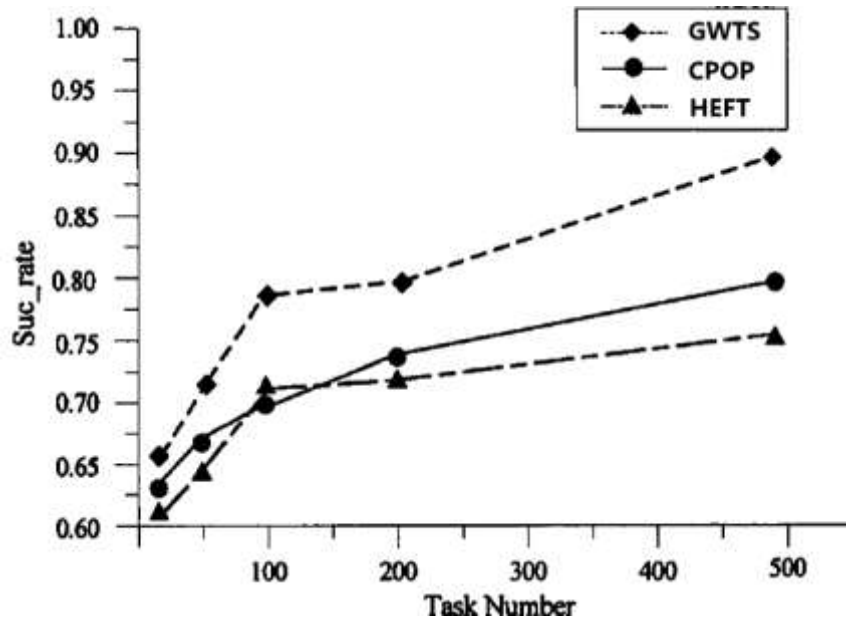


Figure 4. In SC2, when  $\lambda = 0.9$  the Success Rate of Workflow Execution

## 6. Conclusion

This paper proposes a grid workflow task scheduling algorithm in grid environment. The GWTS algorithm first calculates the inverse depth of the task, and then determines the key task as well as the trust degree of the resources. Finally, task scheduling is performed on the execution time and trust degree. In different scenarios, analyzed the performance of GWTS algorithm and other algorithm. Experiments show that, compared with HEFT algorithm and CPOP algorithm, GWTS algorithm reduces the running time of the whole workflow, and improves the successful execution rate of 5-15%.

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