



Optimization of Resource Aware Task-Scheduling Approaches in Cloud Computing

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Abstract

In scientific computing operations, the concept of workflow scheduling optimization is the most difficult task that requires no compromise in the quality of service as defined by the user while workflow execution cost and workflows are to be minimized by keeping in the mind the QoS requirements of the user such as project executional cost and project deadline and improving the simulation performance of energy parameters. Various cost optimization techniques have been suggested to make the economic aspect of SWFS better in the environment of cloud computing. Initial objective of the paper is its wide-ranging literature review that centers around approaches for supporting cost improvement with regards to SWFS in cloud and grid computing. Additionally, give significant guidance and examination to comprehend the SWFS cost optimization approaches. This second objective of this paper is to study problems linked with cost optimization in SWFS by broadly reviewing currently available SWFS methods both in grid and cloud computing and give viewpoints on parameters and cost optimization of SWFS. Paper additionally gives an examination of cost parameters that are dependent on different scheduling stages. Furthermore, each plan is represented and a total contrast of them is introduced to focus on their objectives, properties and short comes. At last, the final comments and future research guidelines are given.

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1 Introduction

The technology of cloud computing is an innovation that helps in utilizing the web and focal remotely build servers to offer versatile types of assistance for its clients [3]. It utilizes a lot of distributed assets of heterogeneous form to convey innumerable various services to its clients with distinguishing QoS prerequisites. Go Grid, Amazon EC2, Google App Engine, Microsoft Azure, and Aneka are a portion of the projecting cloud computing stages [21]. In general, clouds are usually grouped as private, public, hybrid clouds along with the cloud confederation (. An open or public cloud is obtained via any subscriber, however private clouds and their foundation are possessed and gotten to by certain associations. The hybrid clouds [17] manage assets/resources from both private and public clouds. Additionally, [18] because of the accessibility problem of individual clouds, a development towards multi-clouds has risen. which centers around the organization of various clouds [6]. Additionally, [5] the cloud-based services are classified as infrastructure (IaaS), platform (PaaS), software (SaaS) suppliers. PaaS supplier represents access to necessary components across the web to create applications. IaaS give frameworks assets, for example, such as networks, storage, processing, and so on. Likewise, SaaS supplier leases enterprise software as an assistance to clients.. The mechanism of virtualization is considered as an important empowering advancements of cloud computing which permits various VMs to live on a solitary physical machine. VM (compete with a specific PC framework and executes the client issued tasks. By utilizing the launch of the VMs, clients can convey the claims (or applications) on resources with different cost and execution levels [9]. The process [7, 5] of workflow scheduling is one of the noticeable issues in the CC which attempts to outline work process assignments to the VMs dependent on various necessities either functional or non-functional [4,3]. The basic goal [15] of the techniques based on workflow scheduling is to limit the make span by the best possible tasks' allocation to the virtual assets. For instance, a a scheduling plan may attempt to help the guaranteed SLAs, the client determined cost constraints and specified deadlines. Likewise, the solutions of scheduling may consider factors, for example, load balancing, resource use, accessibility of the cloud services and resources in the scheduling-based decisions [5]. This paper represents a total investigation of

the various workflow scheduling schemes planned for CC in the writing works. For this reason, it initially lights up the objectives and types of scheduling and afterward classifies the proposed plans or schemes dependent on the algorithm utilized in every scheme of workflow scheduling. Likewise, objectives, limits, and the properties' of WS plans are deeply surveyed and a total examination of them is introduced.

1.1 Workflow Scheduling

As per work process coalition [2], Workflow [5] is anxious about the automated strategies where the tasks or information are accepted between members as per a characterized set of rules to contribute or accomplish to, an in general business objective. This meaning of work process is business arranged and it is not essential to be the equivalent for cloud. At this time, on account of cloud workflow process, the procedure does not require business procedure however a straightforward procedure can be isolated into a few undertakings. The process of workflow has a few assignments and dealing with the general work process is viewed as an intricate issue. Henceforth to effectively oversee work process a portion of the significant tasks identified with work process should be measured, workflow scheduling (WS) is considered as one such operation. It represents a component based on Workflow Management and can have a noteworthy effect on the execution of work process. An algorithm of scheduling represents a NP-hard issue [2]. Accordingly, comprehensive methodologies are not ideal for structuring scheduling algorithms. Here the process of WS is considered. The workflow process also needs scheduling and this is viewed complex than a standard algorithm based on scheduling. The workflow scheduling has a few procedures associated with it. The mechanism of scheduling is usually isolated into two sections: First one represents a task-based scheduling and the second one goes for resource mapping and undertakings. Both of these are viewed as a part of scheduling. In the initial segment all the assignments (or tasks) are measured and they are planned by the time. A few parameters, for example, burst time, arrival time, and time of completion are generally considered. A portion of the algorithms of these sorts are First Come First Serve, Round Robin Scheduling and so forth. The second section comprises of the tasks and the resources are collectively mapped. The point of proficiently mapping the tasks and the resources is to decrease the all-out expense of work process execution.

1.2 Workflow-as-a-Service in Cloud

1.2.1 Separating Roles for Workflow Management and Virtual Machine

The process of workflow constitutes many figuring stages that necessitate to run with outsider (third-party) packages, which welcomes difficulties in managing VMs. The cloud-based workflows run on VM or VMIs that are launched from appropriate VMs. One can have numerous free VMIs from a single VM. For instance, SM work processes incorporates two undertakings calling Matlab or Octave programming packages and a third assignment invoking Fluent *Computational fluid dynamics (CFD)* package. To implement such a workflow on one of the VMI, one can also introduce every required package throughout workflow-based execution on VMI or it can have at least a single VMs prepared to be sent with pre introduced package(s). The packages, e.g., Octave and Matlab, may have variable disk space and memory prerequisites. On the off chance that we introduce all the packages required for a workflow process in a single VMI during or before runtime, the VMI could turn out to be large and need a great deal of resources. For example, a single package wants a disk space of 10 GB at least and along with 1 GB of memory, and other requirements of 500 MB memory and 20 GB disk[20] [22][23]. For having VMI with the two packages, one requires at least 1 GB memory and 30 GB disk. This approach likewise causes VM-based execution troubles in the cloud. If there are numerous workflow processes with diverse outcast package fundamentals. It is similarly hard to manage VM if one possesses a VM per-workflow in light of the fact that the number of VMs develop together with the workflow process. In addition, VM and the Workflows are definitely coupled in the methodology since the creation of VM depends on the workflow processes.

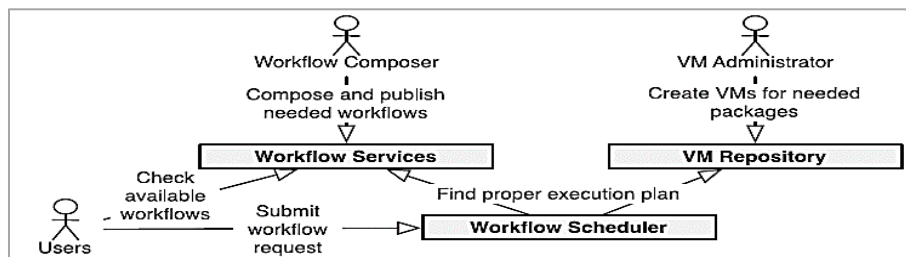


Figure 1: Self-governing role task for the workflow management and VM [6]

Frequently the administrator of VM and the composer of the workflow process won't be a similar individual, consequently it is well thought if these

two jobs are inexactly coupled and work progressively free, as appeared in Figure.1. Preferably, VM head doesn't have to recognize the current and future operational process demands. He only formulates VMs dependent on regularly utilized packages in the area and makes them available for network. For the composer of workflow process, he regularly works with application clients and plans workflow processes as indicated by their necessities. Thusly his primary occupation ought to communicate the logic of workflows, not when and where every work process assignment should run. Every composed workflow process is distributed as an assistance in terms of service.

1.2.2 Services in WFaaS

WFaaS design is appeared in Figure. 2. By succeeding a service-oriented architecture method, all parts in our design are REST services, clarified underneath.

1. Cloud storage service: It is an adaptable excess stockpiling service available in many present cloud conditions, for example, OpenStack Object Storage (Swift) 3 or Amazon S32.

2. Workflow schedule service: It plans tasks and workflows in the workflow processes to appropriate VMIs. Since the entire architecture calls for persistent client work process demands, this administration must have the option to plan tasks/workflows autonomously without the information on future work process demands.

3. Workflow request management service: It acknowledges client requests to run a specific workflow process alongside input information. Such a service bolsters asynchronous demands so that clients can submit newly build demands without waiting for the competition of current ones.

4. VM management service: It is a versatile virtual computing service likewise found in many cloud situations, for example, OpenStack Compute (Nova) or Amazon EC2 5. We will utilize it to oversee VMIs and VMs to execute workflow processes.

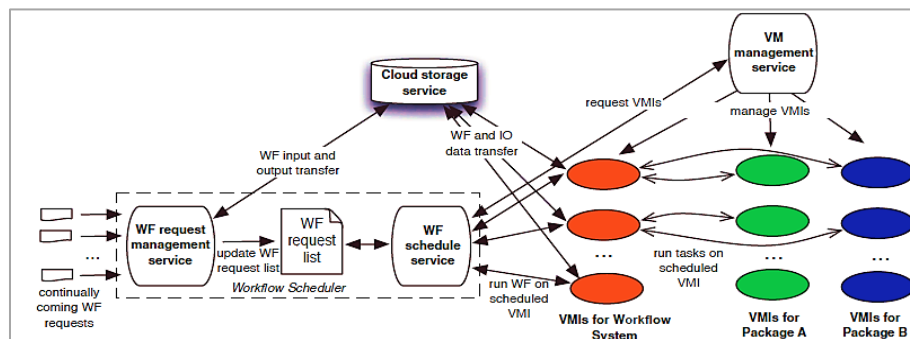


Figure 2: WFaaS Architecture [5]

Following the separation-of-concerns and modularity guideline, one can treat workflow management and VM management independently in the proposed design. To retain every VM as basic, one can limit accessible packages for every VM. The composer of workflow shouldn't know about accessible VM data. While creating another work process, he just indicates the package-based data for each assignment. During the time of execution, workflow process helps in scheduling correct VM for each undertaking and further schedule VMI for various tasks. It helps in making the architecture simple to stretch out for new workflows and VMs.

1.3 Challenges to Workflow Scheduling in Cloud Environment

There are number of challenges faced by workflow scheduling:

1. Quality of Service: Worse scheduling decisions is the main cause of poor QoS. As results, it will lead to long waiting and execution time of tasks, reduced throughput, and inefficient resource utilization.

2. Complex Integrated Architecture: Workflow management system (WMS) mainly is based on workflow DAG used to perform such comprehensive scientific applications based on large scale experiments and is utilized to define, execute, and manage wide-ranging distributed data represented as workflow applications.

3. Load balancing: The optimal utilization of cloud resources demands uniform load must by distributed among different virtual machines so that they should not suffer from underutilization and overutilization situations.

4. Extensive data management: Scientific workflow relates to computation tasks of scientific application which involves analytical steps of large-scale data analysis and mining, accessing and querying database, mathematical processing and other computationally intensive applications [8].

5. Uncertainty: It relates to the uncertainty about knowledge of parameters like number of computing resources available with their speed and capability, the bandwidth variations, availability of resources requires service providers as well as service users to be more concerned for ensuring minimum Quality of Service (QoS).

1.4 Metrics and Algorithms

Following algorithms of workflow scheduling are presently widespread in clouds mechanics and such type of algorithms are concise in Table1. The current algorithms based on workflow scheduling reflect numerous constraints like cost, makespan, time, scalability, speed, resource utilization, success rate of scheduling, throughput, and so on.

Table 1: Review on algorithms based on workflow scheduling

Algorithm	Description	Tool/Methods	Parameters
Scheduling use GA and PSO for hybrid approach [9]	Cross breed GA-PSO approach plans to diminish the expense and makespan and evens out the heap of the dependent errands over the heterogonous sort of assets in the earth of distributed computing.	WorkflowSim	Number of tasks, Task Lengths, Number of resources, Resources speed, Bandwidth
Scheduling optimize by Bat approach [2]	It raises new troubles to capably disseminate assets for the utilization of work processes and besides to meet the customer's QoS necessities.	Binary Bat Algorithm	Cost, Time
Budget and deadline using optimize approach [11]	In this approach using budget and deadline using optimize the virtual machine	Java environment	Cost, Time
Costaware security approach [6]	Here, bat calculation with the assistance of paired bat calculation is utilized for planning work process in a cloud.	CloudSim	Dimension of particles, cost, and the range of particles
Execution or computation time base [4]	Its execution aware optimization approach using workflow.	Default MinMin and GAHEFT (GA with HEFT initialization)	Machine characteristics, workload, data size,
Max-min approach [3]	DBD-CTO work process planning calculation that limits the cost of execution while meeting time period for conveying results and dissect the conduct of the calculation.	FCFS, Cyber Shake, Sipt and Max-Min	Computation time

2 Related works

2.1 Examining Workflow Scheduling Schemes

Frequently in these planned schemes, workflow is usually determined by a weighed DAG or only DAG i.e. Directed Acyclic Graph, where every computing task T_i is demonstrated via vertex. Likewise, every datum or control reliance among tasks E_{ij} is shown by a weighed coordinating edge which might be figured utilizing various factors in each of the scheduling plan [17].

2.1.1 Metaheuristic-Based Scheduling

The schemes based on metaheuristic scheduling in order to produce optimal schedules may employ various algorithms, for example, SA, PSO, ACO, etc [1].

2.1.1.1 ACO-Based Workflow Scheduling

The probability of ant's picking the route relies upon the concentration of pheromone upon that way. If the concentration of pheromone is high, then there will be high probability of that way/selection. An optimal / ideal way can be observed by using the positive feedback strategy [6]. ACO algorithm is utilized by:

Bin Xiang et al. in [4] that suggests a novel WS algorithm namely, Greedy-Ant to limit / minimize the total execution time in regard to an application surviving in heterogeneous situations. Exploratory outcomes show that Greedy-Ant beats the best in class up to 18% in the speedup metric.

Singh et al. in [3] upgrades the cost of execution of those workflow process tasks whose sub-deadlines are lost at the private cloud and moved to the public (open) cloud to finish the executional performance inside the time allotted by the sub-deadlines.

2.1.1.2 SA-based Workflow Scheduling

SA or Simulated annealing [3] is an arbitrary searching strategy for the problems related to global optimization that can deal with localized optimal issues. In the process of annealing it mirrors the process of metals recrystallization. The SA is utilized by:

In [2] that proposes a multi-objective algorithm based on optimization joining SA algorithm with GA algorithm relating to reliability and makespan quality. Trial investigation shows that the algorithm in taking care of the issue of premature convergence and questionable result are superior to GA.

In [6] employ SA to limit the WF cost under time-based constrains and burden adjusting the resources. The researcher's study both the cost-time of the task-based execution and cost-time of the data-based transmission amongst various tasks. This plan initially introduces the objective function and the solution space. The estimation of the objective function is equivalent to the time-cost in total.

2.1.1.3 GA-Based Workflow Scheduling

GA is frequently seen as optimization-based function, and it is associated with wide scope of issues, for example, Data Mining, Image Processing, Pattern-based Recognition, among other issues.

In [4] suggest a cost-effective (meta-heuristic) GA that limits the executional workflow cost complying with the time constraint or deadlines in the cloud computing environment. The proposed methodology considers all the basic attributes of the cloud along with variation and acquisition delay based on performance of VM.

In [2] utilized a novel GA known as chaos-GA to take care of the scheduling issue considering both deadline and client's budget.

2.1.1.4 CSO-based workflow scheduling

CSO known Cat Swarm Optimization has been presented in 2007 by Tsai and Chu and they worked in tracing and seeking mode. In case of seeking mode, the cats don't move and remain in a specific location and sense for the subsequent best move, however in trace mode, they move to their subsequent location with some speed which shows how cats pursue their objective [48].

In [8] introduced a short writing audit of the CSO. After this the analysts provide a detail description of common basic CSO algorithm iterative procedure and its computational phases. At last, CSO algorithm-based pseudo code is additionally introduced to show the usage of this optimized procedure.

2.1.1.5 PSO Algorithm

PSO represents a computational strategy that enhances an issue by iteratively attempting to advance a candidate solution as to a given quality base measure.

In [11] broadened the recently proposed heuristic, specifically, BPSO (Bi-Objective Priority based PSO) algorithm for scheduling workflow applications to the cloud assets that limits the cost of execution while complying with the budget constraint and deadline limitation for conveying the outcome.

(a) Standard PSO

In [4] suggested an improved version of PSO in cloud resources to schedule applications. The IPSO is utilized to limit the total expense of placing the tasks on accessible resources.

(b) Modified PSO

In [9] suggested a versatile PSO algorithm to upgrade QoS guided scheduling of tasks for CC. This mechanism of scheduling focuses on a trade-off between finish time and the cost.

In [5] offers a new algorithm (hybrid), known as CR-AC, consolidating both the CRO i.e. chemical reaction optimization and i.ACO (ant colony optimization) algorithms to tackle the workflow process issue. The algorithm i.e. proposed is executed in the CloudSim toolbox and assessed by utilizing Amazon EC2 evaluating model and real-time applications.

(C) Discrete PSO

In [4] introduced the clinical science applications that are mapped to the IaaS resources dependent on the charging plan and the charging granularity of the cloud resources. The suggested approach is assessed on Epigenomic clinical workflow process application.

In [8] introduced a novel discrete DPSO dependent on the pbDPSO (particle's best position) and gbDPSO (global best position) is received to locate the universal optimal solution for higher measurements. This epic DPSO produces improved schedule with least calculation time contrasted with FCFS (First Come First Serve) and EDF i.e. (Earliest Deadline First) algorithms which equivalently decreases vitality.

(d) Hybrid PSO

In [22] present a novel hybrid heuristic algorithm dependent on gravitation search algorithms and PSO. The proposed algorithm, additionally the transfer cost and the cost, considers deadlines-based restrictions.

In [27] propose a hybrid PSO for cloud-based scheduling. This hybrid PSO accomplishes well contrasted with Minimum Execution time (MET) and Max-Min Scheduling (MMS).

(e) Bi-Criteria PSO

It is suggested in [5] to decrease the cost and execution time underneath the budget and deadline constraints. Every task of the workflow process is allotted with priority utilizing base level, and these priorities are utilized to instate the PSO. Every particle has fitness values demonstrating their velocities and performances that direct the particle's flight.

(f) Set-based PSO

In [7], propose a set-based PSO (S-PSO), the process of workflow scheduling that limits both the makespan and expense builds the reliable quality by tending to the QoS limitations. In this planned scheme, allotment of the service cases is measured as the determination issue from a lot of service instances. In the S-PSO, the set-based portrayal scheme is proper for the cloud WFS issue.

2.1.2 Heuristic Workflow Scheduling

The algorithms based on heuristic method [40] are subjected to the issue and they attempt to discover the solutions by employing problem-based features in a broad manner.

In [14] look at the current algorithms based on heuristic task scheduling. In the first place, the ideas of scheduling, the layer of CC, particularly the concept of scheduling in the PaaS and SaaS layer, as far as possible for improving the QoS, assessment strategies for algorithms and applied apparatuses for assessing the ideas and real-world experimental trial techniques were talked about.

In [21] presents a new HS algorithm, known as HHSA i.e. hyper-heuristic scheduling algorithm, to discover better planning answers for CC frameworks. To assess the performance of the suggested technique, this investigation contrasts the suggested strategy and a few cutting-edge algorithms of scheduling, by having every one of them executed on Hadoop (a genuine framework) and CloudSim (a test system i.e. simulator).

2.1.2.1 Heterogeneous Earliest Finish Time Scheduling

In [4] centers around the issue WF scheduling onto a set consisting of heterogeneous resource with a stochastic model of task-based execution time along with correspondence times. The outcomes show that the suggested methodology essentially beats its deterministic partner and the additional overhead presented is controllable yet additionally adequate.

In [5] proposes a WFS algorithm dependent on cuckoo-search (CS) for discovering a schedule for WF tasks. Here, there is addition of tasks to performance-based list subsequently prioritizing them as indicated by the length of dependencies and execution. CS algorithm is adjusted to locate an ideal mapping of WF tasks on cloud-based resources.

2.1.2.2 Dead line and budget-based Cost and Time optimization

In [24] tries to decrease the execution time and cost and addresses the client characterized budget and deadline requirements. This plan orders the WF tasks as simple tasks and synchronization tasks; the synchronising tasks involves a task having more than a single child or parent task.

2.1.2.3 Iterative Ordinal Optimization-Based

In [16], the researchers suggest a simulation-based method for scheduling scientific WFs on to flexible clouds. The scheduling of multi-task based WFs in virtual groups represents a NP-hard issue. Extreme simulations in long stretches of time might be expected to deliver optimal schedule utilizing simulation based on Monte Carlo method.

2.1.2.4 Priority Impact Scheduling Algorithm

PISA is recommended by [8] which thinks about reasonableness and may possibly schedule numerous WFs in view of fact by considering the tasks and priority weights. This algorithm can expand the success rate of scheduling fundamentally and it considers the priority of the client and broadens the current FIFO-algorithm. This plan characterizes the significance as task weight and workflow priority.

2.1.2.5 Time and Cost Optimization

In [10], the authors recommended a TCHC algorithm for decreasing the time and cost of execution in relation to multiple WF scheduling. The clients these days would prefer to get stuck when the essential own cloud suppliers to schedule or execute the different WFs

2.1.2.6 Multiple QoS Constrained

In [1] the authors present a MQMW i.e. Multiple QoS Constrained Scheduling Strategy of Multi-Workflows to talk about this issue. The system may schedule multiple WFs which are begun whenever and the QoS necessities are considered. Investigation shows that the proposed methodology can expand the scheduling success rate fundamentally.

2.1.2.7 Deadline Constrained

In [12] the authors adjust the PCP algorithm for the Cloud condition and recommend two WF scheduling algorithms: a one-stage algorithm which is known as IC-PCP i.e. IaaS Cloud Partial Critical Paths, and a two-stage algorithm which is known as IC-PCPD2 i.e. IaaS Cloud Partial Critical Paths with Deadline Distribution. Both the algos possess polynomial time base complexity which usually makes them reasonable alternatives for scheduling huge WFs. The simulation base results display that the two calculations have a promising presentation, by IC-PCP performing better than the IC-PCPD2 much of the time.

2.1.2.8 QoS-Based

In [19] suggested a complete QDA scheduling & modelling algorithm for example intensively build WF task scheduling for cloud, which thinks about client-based experience into consideration. The specialists propose a complex WF scheduling method utilizing dynamic programming that centers around how to choose a worldwide optimal way for WF scheduling dependent on QoS, and tending to address the restricting issue.

2.1.2.9 Hybrid Cloud Optimized Cost

In [5] presented HCOC algorithm. It is an algorithm to accelerate the performance of WFS complying with required execution time, yet in addition diminishing costs when contrasted with the greedy methodology.

In [13] have built up an algorithm-based level-based scheduling which implements task on level basis and it utilizes the idea of sub-deadline which is useful in discovering finest resources on open (private) cloud for cost sparing and furthermore finishes WF execution in deadlines. Execution examination and the comparative analysis of the suggested algorithm with min-min method is likewise introduced.

2.1.2.10 Resource Efficient scheduling

In [25] talk about the issue of resource-efficient WFS. To such an end, the analysts presents the MER (Maximum Effective Reduction) algorithm, an asset or resource proficiency arrangement that optimizes the resource utilization of a WF plan produced by a specific scheduling algorithm. MER exchanges the min makespan increment for the maximal asset use decrease by combining tasks with manipulation of resource-based inefficiency in the first WF schedule.

2.1.2.11 Compromised-Time-Cost

In [3] offered a system known as CTC (Compromised-Time-Cost) in [76] which ropes cost-constrained and instance-intensive workflow processes by negotiating the execution cost and time with the client input. The proposed algorithm offers a graphical structure of relationship based on cost and time for the clients to pick a satisfactory trade off formerly the following round of scheduling commences.

2.1.2.12 Meeting Deadlines of Scientific Workflows

In [24] suggested a versatile penalty function for strict constraints as contrasted with other GAs. In addition, the convolution methodology is utilized to alter mutation and crossover likelihood, which can avoid the prematurity and quicken the mechanism of convergence. The outcomes show that it achieves better than the other modern algorithms in the measure of both deadline-restraint meeting total execution cost and probability.

In [6] suggested a SCAS i.e. security and cost aware scheduling for the task's heterogeneous scientific workflow tasks in clouds. The suggested algorithm depends on the meta-heuristic optimization method, PSO, the coding methodology of which is formulated to limit the all-out WF process executional cost while complying with the risk rate and deadline constraints. Broad analyses utilizing three true scientific WF applications, just as CloudSim, show the practicality and effectiveness the suggested algorithm.

2.1.3 Hybrid Scheduling

In [2] offers a hybridised algorithm for scientific workflows scheduling in cloud situations. The suggested algorithm is contrasted with standard PSO and particular schedulers to approve the demonstration. The outcomes show improvement in monetary cost, execution time without influencing the load balance when contrasted with different procedures.

2.1.3.1 ACO + Max-Min Scheduling

In [4] suggest PACO (period ACO_based scheduling algorithm) in CC figuring tasks that schedule the enhancement of the updated methodology of pheromone-intensity and here PACO works well overall. The tests results based on simulation show that PACO performs better than Min-Min (MM) algo both in load balance and makespan.

In [5] propose a high-performance methodology dependent on the MMAS i.e. Max-Min Ant System, which is a productive variety in the group of ACO algorithms, and is proposed to handle the static scheduling (task-graph) diagram for the environments carrying homogeneous multiprocessor, the prevalent innovation utilized as mini-servers in fog-based computing mechanism.

2.1.3.2 GA+ Best Fit+ Round Robin Scheduling

In [9] propose the task scheduler calling GA-based scheduling function for each cycle of task scheduling. This type of function makes a task schedules and assesses the quality of every task with client fulfilment and VM accessibility. Trial results show efficiency and effectiveness of the GA-based model of task scheduling in correlation with the ABC model, and the load index- model, and round-robin model of task scheduling.

2.1.3.3 PSO + Heterogeneous Earliest Finish Time Scheduling

In [15] proposes a technique to finish the execution of tasks prior to deadlines along with the budget limitations. There are various classes under heuristic methodology and amongst them list-based scheduling heuristics yield the best result as far as quality just as with effective work-schedule. In addition, PFET (Predict Earliest Finish Time) is one of the heuristic procedures classified under listed heuristics and has better execution when contrasted with other form of listed heuristics.

2.1.3.4 Market-Oriented Hierarchical Scheduling

In [9] introduced a task-level scheduling algorithm dependent on CPSO. Its optimized cost of overall scheduling and defeat the untimely PSO premature convergence to fulfill the market-oriented quality of cloud workflow process. The suggested system represents a task scheduling which just advances the task-based mapping to VMs.

3 Conclusion

The optimization of cost in SWFS i.e. Scientific Workflow Scheduling especially in grid and cloud computing offers a troublesome task for both the consumers and the providers of the service. The current work assesses issue of SWFS cost-based optimization in the environment of cloud computing. After cautiously examining the papers identified with SWFS most of the cost optimization strategies of SWFS are recognized that ought to be thought of while arranging work in CC. The proposed survey work is planned for giving a solid foundation to working up an affordable SWFS approach that fulfills the requirements of future workflow process applications. We described the related fills in as demonstrated by the formulated classifications and recognized an association between the parameters of cost-based optimization

and benefit of SWFS. Additionally, we presented the most significant cost and time equations, which are used to choose the general SWFS cost thinking about different relevant cost parameters.

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