

A systematic review on the various approaches used for achieving Energy consumption in Cloud

Rishu Gulati¹, Dr S S Tyagi²

¹ Research scholar, Manav Rachna International Institute of Research and studies,

Faridabad, Haryana

² Professor, Department of Computer Science & Engineering, Manav Rachna International Institute of Research and studies, Faridabad, Haryana

¹rishugulati3@gmail.com, ²shyam.fet@mriu.edu.in

Article Info Volume 82 Page Number: 3936 - 3953 Publication Issue: January-February 2020

Article History Article Received: 18 May 2019 Revised: 14 July 2019 Accepted: 22 December 2019 Publication: 20January 2020

Abstract:

Cloud computing is an infrastructure for performing the organization and web application is cost effective way. The implementation of cloud computing has gained attention of computing as an advantage and enhances applications from consumer, business and scientific domains. Though, this operation faces huge energy consumption, carbon dioxide emission and related cost concerns. With energy consumption becoming the major problem for the maintenance and operation of cloud data centres, the cloud computing providers are becoming profoundly concerned. Greater consumption of energy not only translates to greater cost of operation but also badly influences the surroundings. The cloud design is such that it must be power efficient. Data centres are becoming essential infrastructure for assisting the provided services by cloud computing. They consume huge amount of energy reporting for 3 percent of electrical energy consumption globally. The impact of this is that the providers of cloud faces greater costs of operation which leads to data centre's infrastructure increased usage. The main aim of this study is to develop the utilization of computing resources and reduce the consumption of energy under independent quality of service constraints of workload. This study presents the survey of various techniques used for consumption of energy in cloud computing.

Keywords: Cloud Computing, Energy Consumption, Task Scheduling, CPU Utilization, DVFS

I. INTRODUCTION

Cloud computing provides new models of computing where resources namely computing power, online applications, network infrastructure and storage can be shared as services through online. The familiar model of utility computing acquired by several providers of cloud computing is inspiring characteristics for consumers whose request on virtual resources differ with time. The vast scale importance of social networking, online banking, electronic commerce, information processing, electronic government and others

Published by: The Mattingley Publishing Co., Inc.

result in workloads of vast scale and huge range (Uchechukwu et al, 2014). Save and Varshapriya (2015) has mentioned that information processing and computing capability of many private and public firms ranging from housing to manufacture and banking to transportation have been raised speedily. Such a vivid and wide increase in the resources of computing needs an efficient and scalable IT infrastructure involving electrical grids, servers, network bandwidth, physical expenditure, infrastructure, huge capital operational cost and personnel. Rakshith and Sreenivas (2015) has stated that the cloud data



centres are the strength of nowadays demanding information technology infrastructure there is an essential requirement to develop its effectiveness. The services of cloud computing are gaining familiarity nowadays and it is expected that the organizations will migrate from building and owing their own systems to rent the services of cloud computing because the services of cloud computing are simple to use and can decrease both the environmental loads and business costs (Kaur and Kaur, 2015; Dabbagh et al, 2015). The environment of cloud computing needs huge number of ICT equipment such as servers, storage devices, client terminals and communication network devices. The widespread use of the services of cloud computing will highly contribute to rapid raise on the power consumption of information and communication technology (Kuribyashi, 2013; Djemame et al, 2014). Backialakshmi and Hemavathi (2015) has mentioned that the consumption of energy is determined only by the efficiency of hardware but it is also relied on the resource management systemarranged on infrastructure and the running efficiency of application in the system. The energy efficiency influences end users in resource usage costs terms which are decided by the TCO experienced by the providerof resource (Aulakh, 2014). The results of greater consumption of power not only enhanced the bills of electricity but also in additional needs to power delivery infrastructure and cooling system that is uninterruptible power supplies, PDU (power distribution units) and so on (Hammadi and Mhamdi, 2014). With the development of the computer components density the cooling issue becomes essential as huge heat amount has to be degenerate for square meter. It is essential to estimate the power consumed by entire network devices accurately (Pagare and Koli, 2014). Li et al (2017) has stated that it is essential to evaluate the consumption of power much accurately if the carbon dioxide emission must be evaluated from

user's power consumption. every network However, it is not realistic to predict the carbon footprint for every packet in a similar way that the transportation system predicts a carbon footprint for every package. It is essential to regard an easier way of evaluating the power consumed by an individual network (Zakarya and Gillam, 2017; Rong et al, 2016). Moreover, it is anticipated that the power percentage produced by renewable power such as wind power and photovoltaic power generation will continue to increase. Since the power generated by natural ways differs over time the storage of electric power requires to be established to stabilize the supply of power (Mohammed and Tapus, 2017). This denotes that it is essential to consider cases where information technology and communication equipment performs under the situation that the total supply of power feasible is limited. Therefore, it is needed to take the limitation of feasible supply of power into consideration (Tian et al, 2018). Mevada (2017) has suggested an enhanced energy efficient virtual machine placement which applies virtual machines such that the overload of hosts and status of underload is resolves and manage SLA between cloud provider and user. They presented their algorithm to decrease the consumption and accomplish better balancing of load (Nakku et al, 2014). Kumar (2016) has proposed first last algorithm which establishes the energy consumption balance and performance through decreasing migration. Moreover, the complexity of time is also reduced. Li (2013) has suggested an off line method to migrate a virtual machine to much applicable PM and capacity of PM is not adequate and another virtual machine must be selected to migrate from it to free certain space for the needed virtual machine. The outputs reveal that it is much effective. Dhari and Arif (2017) has suggested a load balancing scheme among several virtual machines based on certain threshold. The outputs acquired are compared with other approaches and assured that it is best.



Phi (2017) has proposed a method for enhancing both response and processing time with load balancing. Thus, the consumption of energy is examined by the physical resources efficiency and also determined by system of managing the organized infrastructure resource in and applications efficiency running in systems. Singh et al (2017) has stated that the main issue faced by providers of cloud service is balancing between reducing the usage of energy and distributed performance. Present trend expected that consumption of the energy would, maximize, at the time, cost of the power can effortlessly overtake cost of hardware by a high margin (Xu et al, 2014). It can be inferred that minimizing the energy and power consumption was major goal in the present cloud computing systems.

II. LITERATURE REVIEW

2.1 Energy Consumption Techniques in Cloud Computing:

Rahman et al (2016) has stated that data centre is a set of linked servers utilized by a firm for storage and remote processing. Data centre provides flexible platform to customers by hiding the dependency of platform. User has no requirement of any special hardware all the user required is the thin client. To perform the request of user efficiently data centre have 1000s or 100s of servers which must be handled intelligently. Energy consumption is one of the largest problems faced by Data centre. The energy consumption can be reduced by effective resourcesuse of data centre. Constructing energy effective data centre is not only advantageous for service provider of cloud but also environment friendly. Several energy consumption techniques in cloud computing are discussed below:

2.1.1 DVFS:

Wu et al (2014) proposes an algorithm ofscheduling for the data centre of cloud with a DVFS technique. The scheduling algorithm can effectively enhance the use of resource hence it the can reduce energy consumption for performing jobs. This study also offers a green efficient algorithm of scheduling using the DVFS technique for data centres of cloud computing. Arroba et al (2015) proposes 2 techniques namely a policy of DVFS that considers trade-off between degradation of performance and consumption of energy and analgorithm of novel consolidation that is frequency aware which is essential when allotting a workload of cloud to manage service quality. The results of the study involves the awareness of Dynamic Voltage Frequency Scaling in management of workload which offers considerable savings of energy for conditions under dynamic conditions of workload. Similarly Kaur and Walia (2016) research study proposes a that would reduce the servers technique consumption of energy in cloud data centre by increasing the DVFS algorithm performance using various power models. The model of low power blade with Dynamic Voltage Frequency Scaling has provided a good output that consumption of energy is reduced with similar design of data centre architecture which in turn will support in decreasing the emission of carbon by upholding the overall performance of system (Kumar et al, 2018; Mishra et al, 2019). The below table shows the reviews of DVFS technique for energy consumption in cloud computing:

Table 2.1: Reviews of DVFS Technique for Energy Consumption in Cloud Computing

Source: Author

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Wu et al	2014	DVFS technique	-	Reduce the energy consumption of
					distributed systems



2	Sahoo and Das	2016	Green Energy	Cloud	Makes use of Laxity Analyzer for
			Efficient	Structure	executing every job individually and
			Algorithm using		successfully so that virtual machines
			Dynamic Voltage		are chosen according to Service Level
			Frequency		Agreement level provided by user
			Scaling technique		
3	Arroba et al	2015	DVFS and	Cloud-Sim	DVFS reduces the underused
			Frequency Aware		resources consumption dynamically
			Consolidation		and FAC algorithm decreases the data
			Algorithm		centre consumption of energy while
					handling its quality of service
4	Kaur and Walia	2016	DVFS Algorithm	C++ and	Decreases the energy consumption of
				TCL (Tool	servers in cloud data centre by
				Command	increasing the DVFS algorithm
				Language)	performance
5	Kumar et al	2018	DVFS Algorithm	Cloud-Sim	Decreases the energy consumption
6	Mishra et al	2019	Dynamic Voltage	Cloud-Sim	Resolves the trade off between
			Frequency		Optimize the consumption of energy
			Scaling		and make-span of system

2.1.2 CPU Utilization:

Ali (2014) proposed a predictor based on neurowith an algorithm of prediction to evaluate the needed active servers simulating the objectives of green networking. Such predictor inputs are servers CPU utilization in data centre and the differences of incoming requests with several difference of users. The green networking objectives are referred to handle the Power Management Criteria which assures that entire utilization of Central Processing Unit must be larger than 30 percent. Hsu et al (2014) study presents an Energy Aware Task Consolidation technique that reduces the consumption of energy. Energy Aware Task Consolidation accomplishes this by limiting the use of CPU below a particular peak threshold. Amongst virtual clusters energy Aware Task Scheduling performs this by

consolidating works. To estimate the ETC performance it was compared with MaxUtil a greedy algorithm that aims to expand the cloud computingresources (Madhu et al, 2016; Choi et al, 2016). Urul (2018) presents a dynamic VM migration and allocation approach using CPU utilization prediction to increase the efficiency of energy while handling approved QOS levels in cloud data centres. The proposed approach known as LRAPS evaluates small term utilization of Central Processing Unit of hosts based on their utilization history. This estimation is used to predict under loaded and overloaded hosts as part of their live process of migration (Pattnayak and Pal, n.d.). The below table shows the reviews of CPU utilization for energy consumption in cloud computing:

 Table 2.2: Reviews of CPU utilization for Energy Consumption in Cloud Computing

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Ali et al	2014	Green	OPNET14.5	Manages CPU utilization greater than

			Networking Techniques		30 percent
2	Hsu et al	2014	Energy Aware	-	Reduce the consumption of power in a
			Task		cloud system with growth over
			Consolidation and		MaxUtil algorithm
			MaxUtil greedy		
			algorithm		
3	Choi et al	2016	Task	Cloud	Reduces energy without incurring
			classification-	traces	predefined violations of Service Level
			based energy		Agreement
			aware		
			consolidation		
			algorithm		
4	Madhu et al	2016	Task	Cloud-Sim	Allocates numerous tasks to single
			Consolidation		VM relying on its capability of
			technique		processing estimated in Million
					Instructions Per Second
5	Urul et al	2018	Local Regression	Cloud-Sim	Finds dynamic value of span which
			Automated		makes CPU prediction good so that
			Parameter		the decisions of sound migration can
			Selection		be made
6	Pattnayak and	n.d.	Task	Cloud-Sim	Reduces the idle resources number by
	Pal		Consolidation		allocating a task at an instance to
			Using		virtual machine which is idle presently
			Minimization of		
			Idle Virtual		
			Machine		
			Algorithm		

2.1.3 Resource allocation:

Mohamed et al (2014) has stated that the solutions of energy efficiency aim at reducing huge servers and the disks are required to progress them rapidly within the needed period of time so the energy is consumed by an average of 40 percent over formerly established techniques. Thephysical machines number can be decreased using virtualization by virtual machine consolidation on to shared servers in data centres and motivate them to travel according to the policy of migration. This study presents selection policies and VM migration to enhance the performance of energy efficiency of cloud computing (Ahmad et al, 2015). Bermejo et al (2016) have proposed methods which move through the location design for data centres combining with methods for appropriate resource management considering the

systems energy consumption. This study presents a method of resource allocation that extends the efficiency of system. This method is based on taking decisions at two stages namely the overall system and physical machine stage. Each stage ensures its own proper performance (Patel et al, 2017). Loganathan et al (2017) proposed a



technique of job scheduling to allocate a job to a virtual machine of the already existing active hosts by regarding job pre-emption and classification. Thus, reducing the host number utilized in allocation intern decreases the energy consumptionin cloud data centre. This study proposed job scheduling algorithm classifying the work into 3 various kinds and allocation based on premption policy with the former feasible time of resource which is attached to host (Arulmozhiselvan and Senthamarai, 2016). The below table shows the reviews of resource allocation technique for energy consumption in cloudcomputing.

Table 2.3: Reviews of Resource Allocation Technique for Energy Consumption in Cloud Computing
Source: Author

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Mohamed et al	2014	Virtualization	Cloud Sim	Maximize energy efficiency of
			Machine		resource
			Migration		
2	Ahmad et al	2015	Virtualization	-	Improves the network and application
			Migration scheme		performance
3	Bermejo et al	2016	Resource	Cloud-Sim	Minimize the energy consumption and
			allocation		expand the system performance
			technique based		
			on open loop		
			control system		
4	Patel et al	2017	Dynamic	Cloud-	Resource allocation dynamically for
			Allocation of	Structure	task within deadline
			Virtual Machines		
5	Loganathan et al	2017	Energy Aware	Cloud-Sim	Minimizes the consumption of energy
			Virtual Machine		and maximizes the resource use
			Available Time		
			scheduling		
			algorithm		
6	Arulmozhiselvan	2016	Energy Aware	-	Reduce the consumption of energy
	et al		Live Virtual		
			Migration		
			technique		

2.1.4 Workload Consolidation:

Sridharshini and Sivagami (2015) proposed algorithms to plan virtual machine set to physical machines set using the technique of workload aware consolidation in a cloud centre of data. The main purpose of the algorithms was to reduce the energy consumption by regarding the fact that heterogenous workloads have varied features of resource consumption. In order to compare with various algorithms of measurement of scheduling such as imbalance value of use, average use of resources of cloud data centre are evolved (Wang and Tianfield, 2017). Pahlevan et al (2018) presents an exact modelling of energy characterization for new server architecture based on the technique of FD-SOI process for



computing near threshold. Then the already existing energy versus the performance of tradeoff is explored when virtualized applications with varied memory footprint and CPU utilization features are carried out. Derdus et al (2019) paper examines the link between various virtual machine types of workload and servers energy consumption in a multi-tenant data centres. The experiments were organized using well familiar input/output memory, CPU and intensive network benchmark of workload acquired from PTS (Phoronix Test Suite). The outputs reveal that there is a noticeable variation in the energy consumed amount when virtual machine perform workloads which dominate different physical resources of server. The below table shows the reviews of workload consolidation technique for energy consumption in cloud computing:

Table 2.4: Reviews of Workload Consolidation Technique for Energy Consumption in Cloud Computing
Source: Author

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Sridharshini and Sivagami	2015	Energy Aware Scheduling Algorithm and Energy Aware Live Migration Algorithm	-	Use the resources effectively and provides promising capability of energy saving
2	Wang and Tianfield	2017	Energy Aware DVMC (Dynamic Virtual Machine Consolidation)	Cloud-Sim	Reduces the consumption of energy without compromising the SLA.
3	Pahlevan et al	2018	Energy Proportionality Aware Dynamic Allocation	X86, ARM based Cavium ThunderX and NTC Servers	Improves the next generation NTC servers energy proportionality while assuring their quality of service needs
4	Derdus et al	2019	Virtual Machine Consolidation based on workload	Phoronix Test Suite	Reduces the consumption of energy and accomplish acceptable levels of performance if an optimum mix of workload is met
5	Mosa and Sakalleriou	2017	Parameter Based Virtual Machine Consolidation	Cloud-Sim	Provides flexibility to cloud provider to handle the trade off between other needs and utilization
6	Akhter et al	2018	Dynamic Virtual Machine Consolidation and Optimal Online Deterministic Algorithms	Cloud-Sim	Reduce energy consumption in cloud surroundings



2.1.5 Task Scheduling:

Dhanalakshmi and Basu (2014) proposed a technique to accomplish the major aims of reducing the consumption of energy as well as reducing the tasks make-span. The technique accomplishes the objectives using the placement algorithm of virtual machine to decrease the energy consumption and changed version of Max-Min algorithm to reduce the make-span. Jena (2016) research proposes TSCSA (task scheduling using Clonal Selection Algorithm) to optimize the time of processing and energy. The output results of this research were compared to already existing algorithms of scheduling and predicted that the proposed Task Scheduling using Clonal Selection Algorithm which offers optimal balance outputs for numerous objectives (Thakur, 2014; Zhang et

al, 2018). Atiewi et al (2016) study presents a different methods reviews of energy efficient task scheduling in a cloud surrounding. A brief summary of different parameters of scheduling is also presented. This study determines the best consumption percentage of energy by using DNS and DVFS (Ismail and Materwala, 2018). Alla et al (2019) proposes an effective EATSD (Energy Aware Task Scheduling with Deadline) controlled in CC. The major aim of the proposed technique is to decrease the cloud sources consumption of energy regarding varied priorities of users and optimize the make span under constraints of deadline (Alahmadi et al, 2015). The below table shows the reviews of task scheduling technique for energy consumption in cloud computing:

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Dhanalakshmi	2014	Modified Max-	Cloud-Sim	Reduce the consumption of energy,
	and Basu		Min algorithm		reduce the make span and response
			and Virtual		time
			Machine		
			placement		
			algorithm		
2	Thakur	2014	Task scheduling	Cloud-Sim	Improve the resource use and redeem
			algorithm		the energy consumption in data centres
3	Jena	2016	Task Scheduling	Cloud-Sim	Optimize the processing time and
			using Clonal		energy
			Selection		
			Algorithm		
4	Zhang et al	2018	Energy and	Cloud	Accomplishes efficiency of energy
			Deadline Aware	trace	without establishing virtual machine
			with Non-		overhead of migration and without
			Migration		compromising deadline assurance
			Scheduling		
5	Atiewi et al	2016	Energy efficiency	Cloud	Determines the best consumption
			task scheduling	traces	percentage of energy by using DNS
			algorithms		and DVF
6	Ismail and	2018	Energy Aware	Cloud	Reduces the energy consumption in
	Materwala		Task Scheduling		cloud computing

Table 2.5: Reviews of Task Scheduling Technique for Energy Consumption in Cloud Computing
Source: Author



			algorithm on		
			Cloud Virtual		
			Machines		
7	Alla et al	2019	Energy Aware	Cloud-Sim	Accomplish better performance by
			Task Scheduling		reducing the consumption of energy,
			with Deadline		make-span and develops resource use
			(EATSD)		while meeting the constraints of
					deadline
8	Alahmadi et al	2015	Energy Aware	Cloud	Accomplishes good efficiency of
			Task Scheduling-	Report	energy without sacrificing system
			FFD		quality of service

2.1. 6 Virtual Machine Scheduling:

Parmar and Pandya (2015) proposed an Energy Scheduling Scheme Optimized for cloud environment where the customer needs a service. PaaS where every customer had its own virtual machine. This scheme PEOSS handles the virtual machines as per the time and date. Priority Based Energy Optimized Scheduling Scheme offers auto scheduler which handles virtual machines automatically by Power Off and Power ON, Unpause, Clone and Pause as per the request of customer. Mhedheb and Streit (2016) proposed a novel virtual machine scheduling algorithm implementation and design. This process resolves both temperature awareness and load balancing with a major aim of decreasing the energy

consumption in a data centre. This schedule technique choses a physical machine to host a VM based on user needs, hosts temperature and hosts load while handling the service quality (Li et al, 2018). Pathak (2018) study main aim is to generate an energy aware data centre of cloud by means of consolidation of host and energy aware VM migration under various workload features. This study proposes a novel power virtual machine allocation policy migration algorithm namely MODA (Multi-Dimensional Overload Detection Algorithm) to offer an energy efficient data centre of cloud (Qui et al, 2019; Soltanshahi et al, 2019). The below table shows the reviews of virtual machine scheduling technique for energy consumption in cloud computing:

Table 2.6: Reviews of Virtual Machine Scheduling Technique for Energy Consumption in Cloud Computing Source: Author

S.No.	Author	Year	Technique used	Tools used	Advantages of the Technique
1	Parmar and	2015	Priority Based	VMware	Advantageous for service providers
	Pandya		Energy Optimized	workstation	who offers platform as a service
			Scheduling		
			Scheme		
2	Mhedheb and	2016	Virtual Machine	Cloud-Sim	Reduces the consumption of energy of
	Streit		Scheduling		data centre because of its thermal
			Algorithm		aware technique and assistance of
					virtual machine migration techniques
3	Li et al	2018	GRANITE- a	Cloud-Sim	Reducing energy consumption of total
			holistic virtual		data centre
			machine		



			scheduling			
			algorithm			
4	Pathak et al	2018	Power	Virtual	Cloud-Sim	Reduce the energy by detection and
			Machine			mitigation of hotspot
			Allocation	Policy		
			Migration			
			Algorithm r	namely		
			MODA ((Multi-		
			Dimensiona	al		
			Overload			
			Detection			
			Algorithm)			
5	Qiu et al	2019	Energy effi	iciency	Cloud trace	Achieves savings of power
			and			consumption for memory intensive
			proportiona	lity		workloads and computing
			Aware	VM		
			Scheduling	EASE		
			algorithm			
6	Soltanshahi et al	2019	Krill	Herd	Cloud-Sim	Allocates VM to physical hosts in data
			Algorithm			centres of cloud

2.1.7 Load Balancing:

Shree and Badal (2016) examined different energy efficient load balancing applications of VM performing on cloud[76-81]. This study has proposed an algorithm where the scheduler spreads load to VM having temperature aware scheduling of resource which is distant from its critical temperature and also reduced consumption of power. The main aim of the study is to decrease the temperature of nodes of computing and to spread the workload in an effective way regarding thermal balance and power of the system (Mehta et al, 2016). Anjum and Patil (2017) proposed application scaling operation structure and energy aware load balancing algorithm for ecosystem of cloud. The major aim of this study is an optimal regime of energy of operation and trying to extend the number of servers that are performing in this

regime. lightly loaded and idle severs are changed to one of the sleep states to save energy. To balance the load the servers are being added and avoid the condition of overload or deadlock by deploying the methodologies of scaling (Bose and Kumar, 2015; Thorat and Sonkar, 2015). Gao and Yu (2017) proposed an energy efficient algorithm of load balancing which takes benefit of both virtual machine consolidation and DVFS to decrease the consumed energy by infrastructures of cloud. The experimental outputs of the study show that in cloud computing compared to a RR algorithm for load balancing where the proposed algorithm can accomplish up to 35 percent saving of energy in heterogeneous data centre of cloud. The below table shows the reviews of load balancing scheduling technique for energy consumption in cloud computing:



Table 2.7: Reviews of Load Balancing Technique for Energy Consumption in Cloud Computing Source: Author

S.No.	Author	Year	Technique used	Tools Used	Advantages of the Technique
1	Mehta et al	2016	Thermalandpowerawarevirtualmachinescheduling	Cloud Simulator	Reduction in energy usage
2	Shree and Badal	2016	Thermal and Power Based Scheduling	Cloud Simulator	Reduce the computing nodes temperature and to spread the workload in an effective way regarding power and thermal balance of system
3	Bose and Kumar	2015	Energy aware load balancing techniques	Cloud Traces	Allocate resources to virtual machine requests for reducing the consumption of energy
4	Thorat and Sonkar	2016	Energy aware load balancing techniques	Cloud Traces	Allocate resources to virtual machine requests for reducing the consumption of energy
5	Anjum and Patil	2017	Energy Aware application scaling and load balancing operation model for cloud eco system	Visual Studio 2012	Reduces the time of response, maximize the throughput and increases the resilience of system to faults hindering the system overloading
6	Gao and Yu	2017	DVFS and Round Robin Algorithm	Cloud Infrastructure	Reduce consumed energy by infrastructures of cloud

2.1.8 Power and Thermal Aware Scheduling:

Wang et al (2015) proposes a thermal and power aware VM allocation methods for data centres of cloud. The main aim of the proposed approach is to decrease the overall energy consumption andmigration numbers of virtual machine while avoiding violations of SLA in data centres of cloud. The outputs of simulation reveal that the proposed method of allocation brings essential advantages in terms of performance indices and energy savings (Cui et al, 2015). Ilager (2019) proposes an ETAS (Energy and Thermal Aware Scheduling) algorithm that combines virtual machines dynamically to reduce the overall energy consumption while proactively hindering *Published by: The Mattingley Publishing Co., Inc.* hot spots. Energy and Thermal Aware Scheduling is framed to resolve the trade-off between cost savings and time and it can be tuned based on the needs. This study carries out wideresearches using real world traces of cloud with thermal and power models. Balouch and Bejarzahi (2019) paper proposes thermal aware VM placement and workload for data centres of cloud. The main purpose of this study is to ameliorate through scheduling the data centre energy efficiency. The proposed scheduling method integrates the thermal and power aware scheduling methods which decrease the consumption of energy of a given centre of data because of its thermal aware technique and the assistance of virtual machine 3946



migration methods. The below table shows the reviews of power and thermal aware scheduling

technique for energy consumption in cloud computing:

 Table 2.8: Reviews of Power and Thermal Aware Scheduling Technique for Energy Consumption in Cloud

 Computing

S.No.	Author	Year	Technique used	Tools Used	Advantages of the Technique
1	Chaudhary et al	2015	Thermal aware Scheduling	Cloud-Sim	Saves the cooling and computing energy and ensures life of equipment safety and reliability
2	Wang et al	2015	PowerandThermalAwareVirtualMachineAllocationMethod	Cloud-Sim	Reduce the consumption of energy and number of migration essentially while avoiding service level agreement violations in data centres of cloud
3	Cui et al	2015	Decentralized Thermal Aware Scheduling Algorithms	Cloud-Sim	Improves scalability and reduce temperature compared to state of art thermal aware scheduling algorithms
4	Ilager et al	2019	Energy and Thermal Aware Scheduling	Cloud-Sim	Handle the time of computation and solution quality and avoid hot spots with the rise in consumption of energy
5	Balouch and Bejarzahi	2019	Thermal aware workload and Virtual Machine placement	Cloud-Sim	Reduces the consumption of energy of a given centre of data because of its support of virtual machine migration methods and thermal aware strategy
6	Li et al	2019	Thermal Aware Hybrid Workload Management	Cloud-Sim	Reduce the brown energy consumption while expanding the green energy utilization

Source: Author

III. FINDINGS AND CONCLUSION OF THE RESEARCH

In present years several researches have been undertaken in the cloud computing field. An essential paradigm in the IT sector is Cloud computing. All the physical resources are available in Data centre and the machine consumes power and discharges heat which impacts the conditions of environment. The economic effect of consumption of energy is of huge concern for several firms. The cloud computing firms use large data centres which consists of virtual machines that are placed worldwide and needs huge amount of energy cost to manage. The demand for the energy consumption is developing every day in



information technology companies. The rise in consumption of energy is the most essential issue globally. The development and growth of complexintensive applications of data have spreadlarge amount of data centres creation that has developed the demand of energy. The cloud computing firms faces barriers towards the economic effect in terms of energy cost. This study used different techniques to rise the energy consumption and reduce the waste energy in cloud computing. The choice of good techniques helps the cloud servers to save the energy cost and manages a good service quality for worldwide users. The originality of the study offers a chance to examine which technique is good. In future this study can be developed and better techniques and ways are proposed to save energy for Internet of Things, Big Data and Gaming Data centres. This can be helpful in energy optimization and improvement by undertaking failure analysis in cloud surroundings. The cloud computing resolves the global warming issue by offering eco-friendly surroundings. Thus it can be concluded that cloud computing is used to decrease the consumption of energy by physical resources in data centre and saves energy and also enhances the system performance.

IV. REFERENCES

- [1]. Awada U, Li K and Shen Y (2014), Energy Consumption in Cloud Computing Data Centers, International Journal of Cloud Computing and Services Science, Volume 3, Issue 3, pp 145-162.
- [2]. Marinescu, D. C. (2016). Cloud energy consumption. *Encyclopedia of Cloud Computing*, 301.
- [3]. Save N and Varshapriya J N (2015), Power Optimization in Cloud Computing using different Methodologies, International Advanced Research Journal in Science, Engineering and Technology, Volume 2, Issue 3, pp 6-8.

- [4]. Rakshith K N and Sreenivas T H (2015), Green Cloud Computing-Power Efficiency, International Journal of Computer Science and Information Technologies, Volume 6, Issue 6, pp 5425-5428.
- [5]. Kaur A and Kaur A (2015), Energy Management Models for Efficient Cloud Environment: A Review, International Journal of Advanced Research In Computer Science, Volume 6, No. 6, pp 27-30.
- [6]. Kliazovich, D., Bouvry, P., Granelli, F., & da Fonseca, N. L. (2015). Energy consumption optimization in cloud data centers. *Cloud services, networking, and management*, pp 191-215.
- [7]. Kuribayashi S I (2013), Reducing Total Power Consumption Method in Cloud Computing Environments, International Journal of Computer Networks and Communication, Volume 4, No. 2, pp 69-82.
- Djemame, K., Armstrong, D., Kavanagh, R., [8]. Ferrer, A. J., Perez, D. G., Antona, D., ... & Guitart, J. (2014). Energy efficiency embedded service lifecycle: Towards an energy efficient cloud computing architecture. In CEUR Workshop Proceedings, CEUR Workshop Proceedings, Vol. 1203, pp. 1-6.
- [9]. Backialakshmi M and Hemavathi N (2015), Survey on Energy Efficiency in Cloud Computing, Journal of Information Technology and Software Engineering, Volume 6, Issue 1, pp 1-4.
- [10]. Aulakh, R. K (2014), Energy Efficiency in Cloud Computing, Available at <u>http://www.irdindia.in/journal_ijraet/pdf/vol</u> <u>2 iss8/6.pdf</u>, accessed on 6th September 2019.
- [11]. Hammadi A and Mhamdi L (2014), A survey on architectures and energy efficiency in Data Center Networks. Computer Communications 40: 1-21.



- [12]. Pagare J D and Koli N A (2014), Understanding of Energy efficiency in cloud computing, International Journal of Emerging Trends and Technology in Computer Science, Volume 3, Issue 6, pp 278-282.
- [13]. Li Z, Tesfatsion S, Bastani S, Ali-Eldin A, Elmroth E, Kihl M and Ranjan R (2017), A survey on modeling energy consumption of cloud applications: deconstruction, state of the art, and trade-off debates. IEEE Transactions on Sustainable Computing, 2(3):255–274.
- [14]. Zakarya, M., & Gillam, L. (2017). Energy efficient computing, clusters, grids and clouds: A taxonomy and survey. Sustainable Computing: Informatics and Systems, 14, 13-33.
- [15]. Rong, H., Zhang, H., Xiao, S., Li, C., & Hu, C. (2016). Optimizing energy consumption for data centers. *Renewable and Sustainable Energy Reviews*, 58, 674-691.
- [16]. Mohammed, M. A., & Tapus N. (2017). A novel approach of reducing energy consumption by utilizing enthalpy in mobile cloud computing. *Studies in Informatics and Control*, 26(4), 425-434.
- [17]. Tian, W., He, M., Guo, W., Huang, W., Shi, X., Shang, M., ... & Buyya, R. (2018). On minimizing total energy consumption in the scheduling of virtual machine reservations. *Journal of Network and Computer Applications*, 113, 64-74.
- [18]. Mevada A (2017), Enhanced energy efficient Virtual Machine placement policy for load balancing in cloud environment. International Journal of Current Research and Review, 9(6):1–4. 7.
- [19]. Nakku K, Jungwook C, Euiseong S (2014) Energy-credit scheduler: An energy-aware virtual machine scheduler for cloud system. Future Generation Computer Systems 32: 128-137.

- [20]. Kumar A (2016), Virtual Machine placement in cloud computing. Indian Journal of Science and Technology; 9(29):1–5.
- [21]. Li K (2013) Migration-based Virtual Machine placement in cloud systems. IEEE 2nd International Conference on Cloud Networking (Cloud Net); 2013. p. 83–90.
- [22]. Dhari A and Arif K I (2017), An efficient load balancing scheme for cloud computing. Indian Journal of Science and Technology, 10(11):1–8.
- [23]. Phi N X (2017), Load balancing algorithm to improve response time on cloud computing. International Journal on Cloud Computing: Services and Architecture, 7(6):1–12.
- [24]. Singh, S.; Sharma, P.K and Moon SY (2017), EH-GC: An Efficient and Secure Architecture of Energy Harvesting Green Cloud Infrastructure. Sustainability, 9, 673.
- [25]. Xu, D and Wang, K (2014), Stochastic Modeling and Analysis with Energy Optimization for Wireless Sensor Networks. Int. J. Distrib. Sens. Netw. 14, 5, pp 1–5.
- [26]. Rahman A U, Jadoon W and Khan F G (2016), Energy Efficiency Techniques in Cloud Computing, International Journal of Computer Science and Information Security, Volume 14, No. 6, pp 317-322.
- [27]. Wu, C. M., Chang, R. S., & Chan, H. Y. (2014). A green energy-efficient scheduling algorithm using the DVFS technique for cloud datacenters. *Future Generation Computer Systems*, 37, pp 141-147.
- [28]. Sahoo A K and Das H (2016), Energy Efficient Scheduling Using DVFSTechnique in Cloud Datacenters, International Journal of Computer Science and Information technology Research, Volume 4, Issue 1, pp 59-66.
- [29]. Arroba, P., Moya, J. M., Ayala, J. L., & Buyya, R. (2015, October). Dvfs-aware



consolidation for energy-efficient clouds. In 2015 International Conference on Parallel Architecture and Compilation (PACT) (pp. 494-495.

- [30]. Kaur J and Walia N K (2016), An Enhancement of DVFS Algorithm for Cloud Computing, International Journal of Computer Science Trends and Technology, Volume 4, Issue 4, pp 319-323.
- [31]. Dabbagh, M., Hamdaoui, B., Guizani, M., & Rayes, A. (2015). Toward energy-efficient cloud computing: Prediction, consolidation, and overcommitment. *IEEE network*, 29(2), pp 56-61.
- [32]. Kumar N, Kumar R and Aggrawal M (2018), Energy Efficient DVFS with VM Migration, European Journal of Advances in Engineering and Technology, Volume 5, Issue 1, pp 61-68.
- [33]. Mishra, S. K., Khan, M. A., Sahoo, S., & Sahoo, B. (2019). Allocation of energyefficient task in cloud using DVFS. International Journal of Computational Science and Engineering, 18(2), pp 154-163.
- [34]. Ali Q (2014), Optimization of Power Consumption in Cloud Data Centers Using Green Networking Techniques, Volume 22, No. 2, pp 13-25.
- [35]. Hsu, C. H., Slagter, K. D., Chen, S. C., & Chung, Y. C. (2014). Optimizing energy consumption with task consolidation in clouds. *Information Sciences*, 258, pp 452-462.
- [36]. Choi, H., Lim, J., Yu, H., & Lee, E. (2016).
 Task classification based energy-aware consolidation in clouds. *Scientific programming*.
- [37]. Madhu, B. R., Manjunatha, A. S., Chandra, P., & Murthy, C (2016), Minimizing Energy Consumption in Cloud Datacenters using Task Consolidation, International Journal of

Engineering and Technology, Volume 8, No. 5, pp 2188-2192.

- [38]. Pattnayak P and Pal P (n.d.), Energy Efficient Cloud Computing With Task Consolidation, International Journal of Latest Trends In Engineering and Technology, pp 17-25.
- [39]. Urul, G. (2018). Energy efficient dynamic virtual machine allocation with cpu usage prediction in cloud datacenters(Doctoral dissertation, bilkent university).
- [40]. Mohamed, H. K, Alkabani, Y and Selmy, H.
 A. (2014), Energy efficient resource management for Cloud Computing Environment. In 2014 9th International Conference on Computer Engineering & Systems (ICCES) (pp. 415-420).
- [41]. Ahmad R W, Gani A, Ab Hamid S H and Shiraz M (2015), Virtual machine migration in cloud data centers: A review, taxonomy, and open research issues, Journal of Super Computing, 71 (7), pp 2473-2515.
- [42]. Bermejo, B., Guerrero, C., Lera, I., & Juiz, C. (2016). Cloud resource management to improve energy efficiency based on local nodes optimizations. *Procedia Computer Science*, *83*, pp 878-885.
- [43]. Patel N, Patel Na and Patel H (2017), Energy Aware Resource Allocation for Data Center, Advances in Computational Sciences and Technology, Volume 10, No. 1, pp 1-9.
- [44]. Loganathan, S., Saravanan, R., & Mukherjee, S. (2017). Energy aware resource management and job scheduling in cloud data center. *International Journal of Intelligent Engineering and Systems*, 10(4), 175-184.
- [45]. Arulmozhiselvan L and Senthamarai N(2016), A Survey on Efficient ResourceAllocation for Virtualized Energy AwareLive Migration in Cloud Computing,International Journal of Computer Science



and Mobile Computing, Volume 5, Issue 2, pp 125-131.

- [46]. Wang, H., & Tianfield, H. (2018). Energyaware dynamic virtual machine consolidation for cloud datacenters. *IEEE* Access, 6, pp 15259-15273.
- [47]. Pahlevan, A., Qureshi, Y. M., Zapater, M., Bartolini, A., Rossi, D., Benini, L., & Atienza, D. (2018, March). Energy proportionality in near-threshold computing servers and cloud data centers: Consolidating or Not?. In 2018 Design, Automation & Test in Europe Conference & Exhibition (DATE)(pp. 147-152).
- [48]. Derdus K M, Omwenga V O and Ogao P J (2019), The Effect of Cloud Workload Consolidation on Cloud Energy Consumption and Performance in Multi-Tenant Cloud Infrastructure, International Journal of Computer Applications, Volume 181, No. 37, pp 47-52.
- [49]. Mosa, A., & Sakellariou, R. (2017, August). Virtual machine consolidation for cloud data centers using parameter-based adaptive allocation. In Proceedings of the Fifth European Conference on the Engineering of Computer-Based Systems(p. 16).
- [50]. Akhter, N., Othman, M., & Naha, R. K. (2018). Evaluation of Energy-efficient VM Consolidation for Cloud Based Data Center-Revisited. arXiv preprint arXiv:1812.06255.
- [51]. Dhanalakshmi M and Basu A (2014), Task Scheduling Techniques for Minimizing Energy Consumption and Response Time in Cloud Computing, International Journal of Engineering, Research and Technology, Volume 3, Issue 7, pp 545-549.
- [52]. Thakur, D. S. (2014). *Energy efficient task scheduling in data center* (Doctoral dissertation).
- [53]. Jena, R. K. (2017). Energy efficient task scheduling in cloud environment. *Energy Procedia*, 141, pp 222-227.

- [54]. Zhang, Y., Cheng, X., Chen, L., & Shen, H.
 (2018). Energy-efficient tasks scheduling heuristics with multi-constraints in virtualized clouds. *Journal of Grid Computing*, 16(3), pp 459-475.
- [55]. Atiewi, S., Yussof, S., Ezanee, M., & Almiani, M. (2016, April). A review energyefficient task scheduling algorithms in cloud computing. In 2016 IEEE Long Island Systems, Applications and Technology Conference (LISAT) (pp. 1-6).
- [56]. Ismail, L., & Materwala, H. (2018). EATSVM: Energy-Aware Task Scheduling on Cloud Virtual Machines. *Procedia Computer Science*, 135, pp 248-258.
- [57]. Alla B S, Touhafi A and Ezzati A (2019), An Efficient Energy-Aware Tasks Scheduling with Deadline-Constrained in Cloud Computing. *Computers*, 8(2), pp 46.
- [58]. Alahmadi, A., Che, D., Khaleel, M., Zhu, M. M., & Ghodous, P. (2015), An innovative energy-aware cloud task scheduling framework. In 2015 IEEE 8th International Conference on Cloud Computing (pp. 493-500).
- [59]. Parmar G and Pandya V (2015), Energy -Optimized Virtual Machine Scheduling Schemes in Cloud Environment, International Journal of Research in Science Computer and Management, Volume 2, Issue 2, pp 14-18.
- [60]. Mhedheb, Y., & Streit, A. (2016), Energyefficient Task Scheduling in Data Centers. In *CLOSER (1)* (pp. 273-282).
- [61]. Li, X, Garraghan, P, Jiang, X et al. (2018) Holistic Virtual Machine Scheduling in Cloud Data centers towards Minimizing Total Energy. IEEE Transactions on Parallel and Distributed Systems, 29 (6). pp. 1317-1331.
- [62]. Pathak S, Raj E, Ahirwar M, Borasi E and Pandey A (2018), Energy Efficient Virtual Machine Scheduling Algorithm,



International Journal of Computer Science Trends and Technology, Volume 6, Issue 3, pp 67-71.

- [63]. Qiu, Y., Jiang, C., Wang, Y., Ou, D., Li, Y., & Wan, J. (2019). Energy aware virtual machine scheduling in data centers. *Energies*, 12(4), 646.
- [64]. Soltanshahi M, Asemi R and Shafiei N (2019), Energy-aware virtual machines allocation by krill herd algorithm in cloud data centers, Heliyon, 5(7).
- [65]. Mehta, H., Singhal, S., & Doshi, J. (2016).A Comparative Analysis of Green Cloud Computing Mechanisms, International Journal of Computer Science and Mobile Computing, Volume 5, Issue 11, pp 89-95.
- [66]. Shree T and Badal N (2016), Energy Efficient Load balancing Algorithm for Green Cloud, International Journal of Engineering Research and Technology, Volume 5, Issue 3, pp 505-507.
- [67]. Bose S and Kumar J (2015), A Survey on Energy Aware Load Balancing Techniques in Cloud Computing, International Journal of Advanced Research in Computer and Communication Engineering, Volume 4, Issue 5, pp 397-401.
- [68]. Thorat A S and Sonkar S K (2016), A Review on Energy Efficient Load Balancing Techniques for Secure and Reliable Cloud Eco-system, IJARIIE, Volume 2, Issue 1, pp 248-251.
- [69]. Anjum A and Patil R (2017), Load Balancing For Cloud Ecosystem Using Energy Aware Application Scaling Methodologies, International Research Journal of Engineering and Technology, Volume 4, Issue 5, pp 479-481.
- [70]. Gao, Y., & Yu, L. (2017, January). Energyaware Load Balancing in Heterogeneous Cloud Data Centers. In *Proceedings of the* 2017 International Conference on Management Engineering, Software

Engineering and Service Sciences (pp. 80-84).

- [71]. Chaudhry, M. T., Ling, T. C., Manzoor, A., Hussain, S. A., & Kim, J. (2015). Thermalaware scheduling in green data centers. ACM Computing Surveys (CSUR), 47(3), 39.
- [72]. Wang, J. V., Cheng, C. T., & Chi, K. T. (2015), A power and thermal-aware virtual machine allocation mechanism for cloud data centers. In 2015 IEEE International Conference on Communication Workshop (ICCW) (pp. 2850-2855).
- [73]. Ilager, S., Ramamohanarao, K., & Buyya, R.
 (2019). ETAS: Energy and thermal-aware dynamic virtual machine consolidation in cloud data center with proactive hotspot mitigation. *Concurrency and Computation: Practice and Experience*, *31*(17), e5221.
- [74]. *Balouch A and Bejarzahi A (2019)*, Thermal and Power-Aware VM Scheduling on Cloud Computing in Data Center, International Journal of Engineering Research and Technology, Volume 8, Issue 6.
- [75]. Li, Y., Wang, X., Luo, P., & Pan, Q. (2019). Thermal-Aware Hybrid Workload Management in a Green Datacenter towards Renewable Energy Utilization. *Energies*, 12(8), pp 1494.
- [76]. Uhrmann, L.S., Nordli, H., Fekete, O.R. and Bonsaksen, T., 2017. Perceptions of a Norwegian clubhouse among its members: A psychometric evaluation of a user satisfaction tool. International Journal of Psychosocial Rehabilitation, 21(2).
- [77]. Das, B. and KJ, M., 2017. Disability In Schizophrenia and Bipolar Affective Disorder. International Journal of Psychosocial Rehabilitation, 21(2).
- [78]. Elsass, P., Rønnestad, M.H., Jensen, C.G. and Orlinsky, D., 2017. Warmth and Challenge as Common Factors among Eastern and Western Counselors? Buddhist



Lamas' Responses to Western Questionnaires. International Journal of Psychosocial Rehabilitation, 21(2).

- [79]. Knapen, J., Myszta, A. and Moriën, Y., 2018. Augmented individual placement and support for people with serious mental illness: the results of a pilot study in Belgium. International Journal of Psychosocial Rehabilitation, Vol 22(2), pp.11-21.
- [80]. Monterosso, D.M., Kumar, V. and Zala, K., 2019. Spiritual Practices in The Era of Smartphones & Social Networking: A Comparative Study. International Journal of Psychosocial Rehabilitation. Vol 22 (2) 45, 57.
- [81]. Shafti, S.S. and Ahmadie, M., 2018. Improvement of Psychiatric Symptoms by Cardiac Rehabilitation in Coronary Heart Disease Vol 22 (2) 80, 89.