

An Exhaustive Investigation into Energy Preservation and Cutting-Edge Technology Utilized in Cloud Data Centers

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Abstract: The rapid growth of the digital economy is a result of the data center's rising worldwide energy usage. Data centers are thought to be the hub with the highest energy use. The public is paying close attention to information centers in an effort to cut down on energy emissions and meet energy consumption targets. Enhancing the Cloud data centers energy efficiency is a significant area of a fascination with the scientific community. Researchers are putting an abundance of effort into implementing numerous measures and a feasible energy efficiency implementation approach to be able to meet these goals. In this study, we categorize the current energy efficiency measures, provide an overview of the approaches, and utilized to assess data centers' energy efficiency. In this paper, we look at the current situation and difficulties in assessing the energy efficiency of data centers and provide a survey for enhancing energy efficiency assessment tools to help cloud operators. Through the use of more sophisticated metrics to access advanced data center energy efficiency, this work provides academics and decision-makers with ideas for building appropriate ways for evaluating energy efficiency. It also encourages them to connect theory and practice in energy efficiency evaluation. It is the most substantial and critical step toward achieving sustainable development goals and cutting edge green technologies.

Keywords: Energy efficiency, Energy consumption, Evolution matrices, Data centers.

1. Introduction

The transition from actual to digital capital is a significant transformation that the modern world is starting. Information and suitable infrastructure are the essential components for industrial digitalization and smart city management. The main source of digital capital's production, which powers a robust economy, is data. [1] The fifth generation's commercialization and the quick development of machine learning and artificial intelligence have also contributed to that. Every day, more extensive data will be generated. [2] Because of this, the capacity across data centers is expanding quickly on a global scale. This is accurate for a substantial amount of wealthy nations worldwide, but as a result, as information and data center sizes increased, so did power consumption, which increased at an alarming rate each year. Some major cities have prohibited the construction of additional data centers due to space constraints and increased demand on the power system resulting from the data center's rapid expansion. Every year, without fail. As said by a report, the world's data centers use up more than 416 terawatts of energy annually, or almost 3% of all electricity produced, and this number is only anticipated to increase. That is, twice every four years. According to Psalm study, by 2030, the amount of electricity needed for data centers would

range from 200 billion to over 3000 billion kilowatts.[3][4].We can therefore anticipate that the rate at which the global carbon footprint is increasing will be extremely concerning. The primary causes are the internet-era behemoth's carbon emissions and the data or information center's growing power tied to concentrated industries. Explaining why energy efficiency research is important is pointless. Knowing how the information center is organized hierarchically and in terms of energy use is crucial. Research on energy efficiency [5] both before and after consumption. Although the network device constitutes only a small portion of the overall total, it is nevertheless important to consider it. [6]. most information or data centers are constructed from physical infrastructure that includes IT equipment. Its main components are the temperature control system and the power supply. Every piece of IT hardware must always function with remarkable reliability.

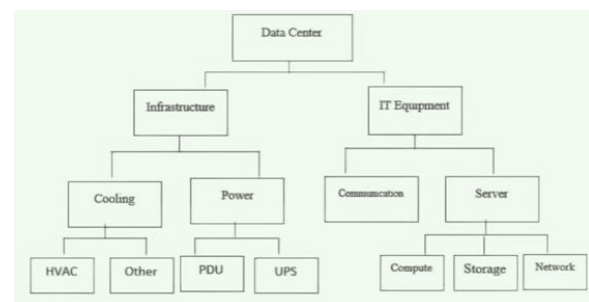


Fig.1. Grading organization Diagram for Data center

Air conditioning, heating, ventilation, and other related equipment make up the majority of the equipment used

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for temperature management. The temperature management is mainly intended to prevent overheating, which is brought on by the substantial heat production from IT equipment. A considerable quantity of electricity is used during the process. According to application scenarios in various information centers, the most typical type of equipment is one server, storage, and network. The facility for power supply primarily includes UPS, PDU, transformer, cabling, backup generator, and other items [7]. The rack approach is employed to oversee the server, per the study primary. Network device and application server, including switches, routers, and other network devices connected to the server. Should be separated into hardware and software components since they are the main drivers of energy consumption in IT systems. Hardware is classified into three primary categories: server tier (a), storage tier (b), and network tier (c). In order to accomplish the goal, the operator of the data center must maintain a high level of tender between the data center industry and appropriate, progressive energy efficiency techniques. This requires the operator to spend a substantial quantity of money on electricity in order to establish a strong and appropriate link between environmental preservation and human development. [8]

1.1. Efficiency Evolution Methods

Evaluating data center energy efficiency takes into account both the physical data centers that are currently in use and the information enters that will soon be constructed. Measurement-based, simulation-based, and analytical modelling-based methods include the three main categories of methods and methodologies utilized to evaluate the energy and efficiency of data centers. In [9][10].the assessment of accumulation accuracy is the least accurate of the three, whereas measurement-based evolution has the highest accuracy.

Table 1. A summary of review articles on data center energy efficiency

Grouping	Motif
Energy Effectiveness	The data center industry's current state of power measurement and energy efficiency technology
Temperature control	Various data center thermal performance assessment parameters at different levels
Energy efficiency	Demand response and energy efficiency in small and medium-sized data centers
Performance metrics	Green performance measures for the environmental performance of data centers

2. Assessment Based Measurement

Energy-efficient evolution currently focused on combining engineering calculations with short-term size measurement. The most straightforward and accurate approach is evolution. However, measuring the metric related to data center energy efficiency required a substantial quantity of labour and funding. A technique typically requires the use of specialty tools. For instance, a number of studies routinely use power distribution units to measure the energy usage of its devices. Because each measurement instrument has some inherent uncertainty, researchers have been able to develop precise measurement techniques that improve measurement accuracy for specific pieces of equipment. The precision of measurement evolution rely on the process of evolving metrics in addition to the aesthetics of the measuring apparatus. The US Green Grid organization has developed an energy-efficient indicator for data centers or information centers. PUE 2007 [11] was widely used as a straightforward and approachable valuation indicator in the data center sector. Due to a specific PUE constraint, only a broad assessment of the data centers or information centers may be made in this way. Furthermore, only systems that are already in their Position are subject to measurement-based evaluation techniques. Central and Eastern European countries have created a system of energy efficiency value standards based on actual measurement; nevertheless, there is currently no main authorized technique. Rather than data center energy efficiency, it emphasizes the application of water resources and carbon emissions.

2.1 Simulation-based assessment

One major limitation in assessing Energy efficiency in data centers is difficult for achieving even in the solution setting when working with big scale computing systems. Counting simulation has been surmounted to become the most popular method[12][13] of truly Mary testing simulation tools of a flexible approach to access data center energy efficiency quickly evaluate the energy-saving capabilities of cloud computing system that is simulated. Green cloud and cloud Sim are the two most often used methods for accessing not only already-existing systems but also those that have not been completed yet. Greek Life developed Cloudsim [14], and the University of Melbourne in Australia was responsible for the river's project. To satisfy the unique requirements of data centers, the majority of recently created simulation tools have been expanded based on cloud SIM. Use of simulation to highlight glaring shortcomings in the instrument. What time advice means and can motivate a visa Additionally, there are some issues with the simulation platform that make it possible for the

amount of energy used model to not function, which means that the outcome of using simulation methodologies to access the energy efficiency cloud data [15] center or information centers is not advised, even though it might be used as a first step in some circumstances.

2.2 Analytical modeling in the assessment

In analytical assessment predicated on the development of mathematical methodologies to provide suitable methods that, generate the relationship between load, performance, and energy consumption by abstracting the system. Energy evaluation efficiency that greatly reduces the burden is related to it. In order to identify and forecast differences from the actual matrix, the model's parameters are entirely dependent on system measurements. It's common to make assumptions and simplify things.

Table 2. High availability model for analysis of performance and energy

Modeling Methods	Study Emphasis
Machine learning	Energy efficiency determined by behavioural modifications
Analysis of energy	Energy usage of the cooling system in a data center
Data interpretation	Data center dedicated cooling system
Fuzzy comprehensive assessment technique with neural network	Carbon efficiency performance evaluation
Energy decomposition	Energy performance of district heating substations
Bayesian networks	Allocation of cloud resources

Different behaviors were seen in complex systems using these kinds of modeling approaches. Because the system's specifics could not be explained. Setting up additional Characteristics variables to represent the system in greater depth is one method we may use to improve system or model performance. Though there may be other factors that affect the model's basic operating principle, just adding more specific variables does not ensure that it will get better. More accurately than these conventional approaches, machine learning—and deep learning in

particular—can abstract complex systems. Scholars are now concentrating on trying machine learning for simulation as a result.

3. Metrics for evaluating energy efficiency

The benchmark for the evolution of measurement energy efficiency is a matrix of this kind. It has benefits for the operator to operate, comprehend possible inefficiencies better, and enhance their effectiveness by the examination of parameters. Which support industrial innovation and are important for advancing research goals related to environmental sustainability [16] within data centers.

3.1 Metrics are categorized

A modern cloud data center's architecture shown in more detail such a mesh structure depicting adjustable energy efficiency evolution matrices is a sophisticated system that incorporates numerous IT devices and infrastructural components. It is important to take into account factors other than the measurability of practice matrices. Craid granularity metrics, medium granularity metrics, and fine granularity metrics are the three categories that make up the subsist energy efficiency evolution matrix in a soft data center [18] [19]. We will make an effort to learn more.

3.1.1 Metrics of coarse-granularity

One of the several matrices that the researcher has proposed at the level of the whole data center. There is some roughness to these mattresses. However, they are simple to grasp. PUE (20) One of the metrics that data center energy efficiency is measured as the ratio of the center's overall energy consumption to the energy consumption of its IT equipment inside a comparatively small compound compared to other matrices. The fact that it only requires one matrix to assess the data center makes it quite popular. Overall energy efficiency and the elimination of certain features required in a data center, even while some energy efficiency aspects are missing from specific data center components The final product is not suitable for data center energy saving procedure advising.

3.1.2 Metrics of medium granularity

In order to provide energy efficiency information for specific infrastructure equipment and green energy in the data center, the researcher may have overlooked some suggested ideas by using coarse granularity matrices, a variety of medium granularity matrices, and data center components and sub-components. In order to maximize energy efficiency, it was summed up by utilizing green energy and cooling equipment; these techniques'

Diversity and applicability produce more thorough and accurate results.

3.1.3 Metrics of fine-granularity

The data center's IT operation is under the control of each of its two components performance matrices like memory, CPU, network, and storage make it impossible to measure Data centers' energy efficiency directly. Despite the fact that the performance watt rate can be applied to evaluate changes in energy consumption and performance. It is highly intriguing and greatly beneficial for cloud operations, with buyers or users focusing on performance indicators. In an effort to provide better services, operations frequently disregard the needs of users or customers, even though wind energy reductions will be feasible to a substantial quantity of.

Table 3. The benefits and drawbacks of data center metrics.

Metrics		Benefits	Drawbacks
PUE	Evaluation metrics that are acknowledged by the sector, simple to gauge.	Too basic, failing to take the details into account	
DCeP	The most closely aligned definition of energy efficiency	challenging to quantify	
DCiE	The simple-to-measure inverse value of PUE	unable to record minor alterations	
TUE	Resolving the issue where PUE rises when hardware energy usage decreases as a result of technological advancements	Hardware energy consumption is only predictable and difficult to monitor.	
DCPE	Able to gauge the effectiveness of data center performance	Hard to quantify and describe useful labor	

4. Benefits and drawbacks of metrics

Coarse granularity matrices track the overall energy consumption of data centers; medium granularity metrics, on the other hand, are concentrated on supporting the specifics of the subcontinental energy consumption pattern for coarse granularity matrices. Fine-grained matrices primarily intended for use with IT equipment; they cannot

directly applied to energy efficiency. We must comprehend and research the benefits and drawbacks of each matrices separately to get past this.

4.1 PUE's benefits and drawbacks

Data centers continue to employ PUE as the primary and crucial measurement standard for the advancement of energy efficiency. It offers several benefits in addition to motivating and user-friendly computation techniques that are not restricted to data center and storage capacity server architecture. As the data center business continues to grow, there is an increasing need for long-term sustainability and high-energy efficiency. Even so, PUE has steadily revealed some shortcomings. Numerous studies are devoted to enhancing PUE [21] [22] [23].

The following are some of the drawbacks of PUE that we outlined:

- i. A data center IT infrastructure serves as its cornerstone from the perspective of the PUE. The study is the reason we are not able to succeed to determine the energy efficiency of the IT equipment in the matrices. To get a beta efficiency, we have to make an effort to improve IT equipment. Whether the procedure will produce, a satisfactory product remains to seen, considering the data center productivity regarding the quantity of electricity required for IT equipment.
- ii. PUE only provides a general overview of the data center's energy efficiency due to its lack of specifics. There is no way to find out how to make a data center more energy-efficient.
- iii. In order to fulfil the demands of sustainable energy development, we must address a number of crucial issues, including the use of energy, carbon, and renewable resources, as well as the utilization of modern data centers and IT equipment, which can be very challenging to operate on a specific index. To discuss every component of renewable resource utilized in energy efficient data centers. So that we must develop more effective methods for evaluating energy efficiency.

5. Issues and the state of the assessment of energy efficiency

The depletion of fossil fuel resources and rising energy consumption are the results of industrialization and population growth. Preserving the environment and extending the life of finite fuel supplies need sustainable energy use. More than 40% of the energy used globally is employed in the construction sectors. This necessitates coming up with strategies to lower energy consumption through improving the effectiveness of machinery used to generate and consume power as well as energy conservation through appropriate system design and use.

5.1 Energy efficiency assessment status

The data center's energy efficiency has rapidly improved in recent years. Research and the data center sector create increasingly evolving standards. In the most recent study, standards for reducing carbon dioxide and ensuring efficient resource usage are developed based on important performance measures. Researchers provide standards for application platform energy matrices (APee) and data center server energy-efficiency matrices (SeeM). The efficacious for critical performance indicators. The Green Data Center Coordination Group (GDCCG) of CeN, NeLeC, and eTSI will implement data center design standards in their most recent report. As of right now, industry can see more opportunities with regard to energy management and environmental viability in the near future. Think about the product that negatively affected data centers and caused harm. Influence on air pollution and condensation. The standard energy efficiency for assessing the test center has always been expanded by the researcher, not the academic sectors. A number of signs point to a significant rise in energy use. Boost the number of compute instances. Likewise, large data centers never stop adding servers. The energy efficiency of the server was inadequate as more work needs to be done before data centers are more energy-efficient.

5.2 Energy-efficient research

Although they are widely utilized, researchers to assess data centers created multiple matrices. More developers in the data center sector are ignorant of evolution matrices, and we know very little about the measures used to evaluate energy efficiency. Research on connectivity is not produced by the industry. The rate at which technology is developing has left us ignorant of energy efficiency criteria. Only energy efficiency metrics are appropriately pushed because of scholarly research. Moreover, the data center sector faces a number of troubling difficulties. Researchers ought to concentrate on the real needs for the advancement of energy efficiency. The most liberal and efficient strategy is adopted at the time of choosing an assessment method for a particular study.

5.3 Challenges in Assessing Energy Efficiency

As of right now, no systematic theory has developed regarding the evolution of data centers energy efficiency. Since there are no universal standards for it, extra metrics taken into account when choosing the right data center. The data center's unique structure places numerous restrictions on the assessment of energy efficiency. Standards are currently being established for physically present data centers. Researchers hope to develop a leading strategy for data center energy efficiency development that can coordinate the growth of IT equipment with data center energy efficiency. Which are essential parts of a data

center. IT equipment energy efficiency will not be provided for cooling, and vice versa. Therefore, the goal of the IT equipment and auxiliary for energy evolution metric [24] was specifically to identify the need to reflect the energy efficiency of IT equipment. It is unthinkable to consider goals like cooling efficiency, carbon utilization rate, and energy efficiency metrics for IT equipment. They are intended to increase data center cooling efficiency and the rate at which renewable energy is utilized. Consider employing PUE to apply content in various areas such as IT equipment utilization rate, carbon utilization rate, water utilization rate, and renewal energy utilization rate instead of relying on evaluating metrics. It is feasible to produce a collection of matrices for data centers' total energy efficiency.

6. Recommendations for Assessing Energy Efficiency

Metrics related to energy efficiency rank among the most crucial for assessing energy efficiency. It can be identified as blood (vital fluid) and a problem for assessing energy efficiency. As the most significant technique for evaluating energy efficiency, we suggested a several methods for improving PUE performance. We also applaud the novel strategies and highlight their value for sectors experiencing transitions in concerns that fully account for the unique data centers energy efficiency.

6.1 Methods for enhancing PUE

PUE has received a lot of promotion lately despite its many shortcomings. It is marketed as having an easy-to-understand mechanism. Nonetheless, the metric In accordance with the value determined by the data center operator, under a more progressive stage. The potential factor that determines the PUE value is still not giving the expected outcome.

Researchers are at work to increase PUE in order to motivate cloud operators and decision makers to develop more practical data center methods. Root is utilized in part as an additional statistic to determine the possibility of energy-efficient metrics. Grid usage efficiency was established for more improved energy evolution tactics. However, it is impossible to compute and compare the PUE Theoretical model data under different natural cooling assumptions without first validating the actual general model for PUE data. The primary input for the prediction model of PUE [26] [27] Depending on the energy system parameter and climate variable. Predicting the major impact on the data center requires careful consideration of the temperature component. Seasonal variations and the climate have an impact on the evolution of energy efficiency as well. Results approved after comparison with various graded and sized PUEs.

6.2 Novel Energy Efficiency Metrics Development and Implementation

Authorities that develop data center evolution measures include international, regional, local, and professional entities as well as industry groups, researchers, and standardization bodies. Acknowledge firmly that none of the suggested matrices are typically applicable anywhere in the world. The proper general approach, calculating method, and standard are needed for that. Researchers and stakeholders have sought to standardize the current energy-efficiency matrices in order to meet the different needs of individuals, but they fall short of what is needed to meet the new challenges and developments [28]. Numerous matrices are employed in real-time analysis of tiny cooling systems for data centers and energy economy. To sum up, new energy performance matrices created to be able to assess data centers' energy efficiency.

6.3 Determination of Evolution Matrix

Due to the limited scope of the multimetric evolution approach, we are unable to combine different matrices. Not every property of a metric fits it. Increased selection necessitates adherence to certain rules

- i. The arrangement of the matrices is orientated. When an enhancement needs to be reversed, our goal is to maximize the performance of data centers.
- ii. Employ certain matrices where the numerical value for specific matrices may be measured; this should need minimal time or resources and not interfere with routine tasks.
- iii. Matrix operations must be independent of one another, with no overlapping rules permitted between them.
- iv. Matrices are verifiable and responsive to changes in the status of the data center.

6.4 Identification of different weighting strategies used in matrices

In multi-index energy-efficiency progression, weighing is one of the most crucial processes. The weight's size indicates how essential the relevant matrices are. Diverse weight distributions will result in varying energy efficiency evaluation values. Data center's actual state of energy efficiency can be carefully considered when weight is allocated appropriately. Subjective weighting, objective weighting, and a combination of the two are the three typically utilized weighting techniques.

6.4.1 Empirical techniques for weighing

Hierarchical analysis procedure (AHP) [29] Assign sitting topic weights via representation. We should include a consistency test. This introduces "Delphi" as one approach [30]. what the adoption of a cloud-computing component will cost. We can receive anonymous inquiries and feedback using that manner [31]. The weighing techniques discussed are mature, tried-and-true, and highly trustworthy. It takes an industry specialist to judge or score

different matrices. The real aspect that the expert considers methodically is the one that authorities or experts organizations consistently try to ensure is reliable when it comes to subjective approaches. In order for the weight to more closely reflect the relevant variables. In addition, a single organization including a team of experts needed to establish global communication standards.

6.4.2 Approaches for objective weighting

In principle component analysis, the waiting approach is typically employed. A number of methods, such as the weight of entropy technique, mean square deviation method, multi-objective planning approach, etc., are useful for sampling data since they eliminate the influence of subjective elements. In addition, it has significant objective data limitations based on how sample data changes and wait times. A sufficiently large and more stable set of precise sample data is required to solve the objective weighting. Applying data science methods such as neural networks and linear regression, deep learning is used to sample data to get the objective weight, which is a relative approach. It requires an enormous amount of material, financial, and human resources to gather sufficient measurement data for measures to improve energy efficiency in cloud data centers. The amount of energy efficiency measurement method still unresolved and yet to come to a consensus within the industry. Currently extremely challenging or demanding to develop a single standard for data center construction since it is very difficult to employ weight by numerous matrices.

6.4.3 The approach of combined weighing

Subjective waiting techniques are actually closer, but the person making the decision influences them. The decision maker's judgment mainly determines the expertise and data. Subjectivity will have a bearing on the results' correctness. Conversely, the objective weighting approach is highly dependent on more scientific results obtained from the evolution of the actual measurement data on sample; still, there is a possibility of some degree of information loss in this method. Whenever these two are combined, information loss is reduced or minimized and the projected results are as near to the real-life results as possible. The overall multi-metric evaluation method combined with the process. [32] Since data centers contain complex structures and varying scales, it is challenging to create a single, universal system for evaluating energy efficiency. Numerous matrices in practice have yet not embraced the mathematical integration techniques for the advancement of energy efficiency. [33][34] Approaches of evaluating data centers' energy efficiency that are comparable to one another or that are suited for a multi-metric evaluation method.

Author contributions

Monojit Manna: Conceptualization, Methodology, Editing, Field study, preparation. **Indrajit Pan:** Visualization, Investigation, Writing-Original draft, Validation. Field study.

Conflicts of interest

The authors declare no conflicts of interest.

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