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Efficient Energy Sources Scheduling in Green Powered Datacenters: A Cloudsim Implementation

Enida Sheme[†] Patricia Stolf[*] Georges Da Costa[*] Jean-Marc Pierson[*] Neki Frashëri[†]

Polytechnic University of Tirana, Albania[†]
esheme@fti.edu.al, nfrasheri@fti.edu.al
University of Toulouse, France[*]
patricia.stolf@irit.fr, Georges.Da-Costa@irit.fr, jean-marc.pierson@irit.fr

Abstract

In this paper we address the issue of managing different energy sources which supply green powered datacenters. The sources are scheduled based on a priority scheme, aiming to maximize the renewable energy utilization, minimize the energy used from the grid and optimize battery usage. Dynamic power capping technique is used to put a threshold on the drawn energy from the grid. The algorithm is implemented and tested in CloudSim simulator. Renewable energy is considered as solar energy. A workload scheduling algorithm is already implemented for higher renewable energy utilization. The results show that the proposed scheme is efficient and it is a promising direction in the field of the optimization in datacenters using renewable energy.

Keywords green datacenter, renewable energy, grid energy, battery, priority scheme, dynamic power capping, simulator, CloudSim

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I. Introduction

Recent studies have addressed the topic of using different sources of energy, mainly renewable one, to supply datacenters. As such, studying the energy sources engagement with resource scheduling has become one of the research directives of this field. Some of the existing techniques take in consideration renewable energy only with batteries and/or grid as a backup. This approach has two disadvantages: first it is not realistic for the current conditions when grid is still the main source of energy in most of datacenters. Second, it requires high capacity of batteries to compensate energy needs in time periods when renewable energy is lacking. This means higher costs, longer charging time and higher environmental risks from battery pollution.

In our paper we propose a new prototype scheme for managing three sources of energy: renewable, grid and battery, following this priority level. The aim is to maximize renewable energy utilization, minimize energy taken from the grid and optimize battery usage. Dynamic power capping technique is used in order to limit the grid power used to supply the datacenter. The proposed algorithm is evaluated through simulations.

The paper is organized as follows. Section II describes the energy context where the new sources scheduling algorithm

is studied: the energy consumption of a chosen datacenter and the renewable energy used to supply it. At section III the proposed scheduling scheme is introduced and its implementation in CloudSim simulator is illustrated. Another workload scheduling algorithm is integrated in the simulator, being described at section III.2 . Section IV illustrates the conducted experiments and the results of implementing the proposed priority scheme. The paper finalizes with conclusions at section V .

II. Energy Consumption and Renewable Energy

In this section we evaluate the energy consumption of a datacenter running a given workload, describing datacenter parameters and workload characteristics. The available renewable energy is explored and presented as well, based on real weather data in Tirana, Albania.

II.1 Energy Consumption

The energy consumption is evaluated in a simulator environment, running a chosen workload over a specific datacenter. The datacenter size is chosen based on similar experimental studies in the field of energy efficiency in datacenters. Datacenter represents the processing entity in our system. It runs

the workload and consumes energy, which we track during 24 hours of simulations. Datacenter parameters are chosen based on similar experimental studies in the field of energy consumption in datacenters and typical datacenter size in Albania. To run the simulation we configured the number of hosts equal to 100 and the number of virtual machines running over hosts equal to 200. This means, 2 virtual machines run in every host. The host model is HP ProLiant ML110 G5, Xeon 3075 , processing capacity 2660 MHz, 2 cores and RAM of 4GB. The workload chosen to run the experiments represent a synthetic reproduction of a Google workload, scaled over our own simulating datacenter parameters. A Google trace file was published in 2011, giving detailed information of 12.000 Google servers traffic over 29 days, processing various types of applications. This workload data are studied in order to know its characteristics. The main findings of studies [1], [2], are used in our workload in order to produce patterns that resemble to the Google workload.
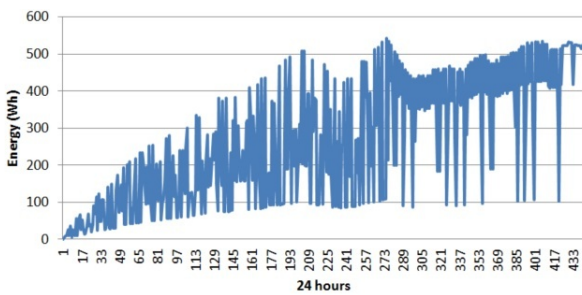

Figure 1: Energy consumption over 24 hours of simulation.

As such, we configure the following workload parameters for our study: total number of jobs, their length, deadline, resource requirements and inter-arrival time. The chosen number of jobs is 400, where 200 of them are short, 150 are medium and 50 are long. The length of short jobs varies from 5 to 7 minutes, medium jobs from 25 to 50 minutes and long jobs from 100 to 300 minutes. The jobs length is generated through Poisson distribution. Deadline is another parameter we set, which is the limit of time it can pass till the job is fully completed. Based on bibliography [1], [2], we categorize jobs into three types of deadline: loose, medium and urgent. 130 of short jobs have loose deadline, which means they are tolerant to be postponed for running in a later moment, 50 of short jobs have medium deadline and 20 are urgent. Out of 150 medium length jobs, 100 of them have loose deadline and 50 have medium deadline. Meanwhile, all long jobs have loose deadline. Loose, medium and urgent deadline is set in proportion to the length of jobs. Regarding

resource requirements, half of short jobs require an average of 25% of CPU usage and other half requires 50% of CPU. 50 out of 150 medium jobs require 25% CPU and 100 of them need an average of 50% CPU. While long jobs need to use an average of 80% CPU. The inter-arrival time is set to every 7 minutes for short jobs, every 10 minutes for medium length jobs and every 30 minutes for long jobs.

The energy consumed by the datacenter running the described workload over 24 hours time of simulation is evaluated through CloudSim simulator. The total value of energy consumption is 120 kWh and its distribution through time is shown in figure 1 .

II.2   Renewable Energy

In our study, we used solar energy to represent renewable energy. A. Maraj presents a study regarding solar energy in Tirana [3]. We acquire the solar energy data from the results of this study. The parameters are provided from the database built through the utilization of a data collecting system, which is installed on behalf of the Department of Energy, Faculty of Mechanical Engineering, Polytechnic University of Tirana. Solar power irradiance on a 45 degrees tilted 1 squared meter solar panel, installed over the terrace of the central building of this University, has been collected, providing data for every 5 minutes of its daily operation. We consider a typical clear summer day as input for renewable energy in our experiments. The specific date is July 16, 2010. Further details on solar panel specifications and results of the study are explained in the article [3]. The solar irradiance over 24 hours of a typical summer day in Tirana is shown in figure 2 .
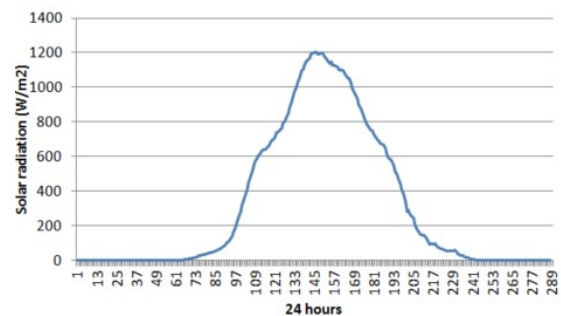

Figure 2: Solar irradiance over 24 hours.

III. Energy Sources Scheduling Scheme

In this section, we describe the working platform, CloudSim simulator, and a workload scheduling algorithm already implemented aiming to maximize the utilization of available renewable energy. We further present the analysis and implementation of the energy sources scheduling algorithm, which is the new prototype scheme we propose in this paper. A detailed explanation of how this algorithm works is described at section III.3 .

III.1 CloudSim Simulator

CloudSim is an extensible simulation toolkit that enables modeling and simulation of Cloud computing systems and application provisioning environments [4]. The CloudSim toolkit supports both system and behavior modeling of Cloud system components such as datacenters, virtual machines (VMs) and resource provisioning policies. Its main functional entities include:

- Hosts: physical machines where the jobs are to be executed.

- Virtual machines: virtual entities running over real physical entities.

- Cloudlets: representing the workload or the jobs to be executed in the datacenter.

- Broker: a scheduler which allocates virtual machines to hosts and cloudlets to virtual machines.

CloudSim is chosen as a simulator because of its high rate in reviews of the energy efficiency in datacenter field, 7 years among researchers and still being widely used, open source code and a rich forum of programmers and researchers.

III.2 Workload Scheduling Algorithm

The algorithm already implemented in CloudSim regarding efficient workload scheduling aims higher leveraging of available renewable energy. The main idea is to postpone non urgent jobs towards periods of time when renewable energy availability is higher. Equivalently, some jobs might be run urgently though they are not urgent in order to exploit current available renewable energy if this level is predicted to be decreasing in the near future. The steps of this algorithm are presented at figure 3 .

Basically, the code is divided in two sections, testing if the available renewable energy is increasing or decreasing. In each case, the behaviour will be different. After testing the urgency of the arrived job, the algorithm decides to run it if it is urgent or postpone it if it is not urgent. The amount of time it will be postponed depends on renewable energy prediction and length of the job. If it is an increasing period, than short jobs are postponed with a time period equal to their length, medium jobs are postponed to medium time between arrival and start deadline time, while long jobs are postponed at their maximum allowed time, as long as it does not violate the desired quality of service. Otherwise, if it is a decreasing period, the behaviour will be contrary to the mentioned approach. Short jobs will be postponed at their maximum, as they require less processing resources, while the long jobs are immediately run in order to use the available solar energy, as figure 3 presents.
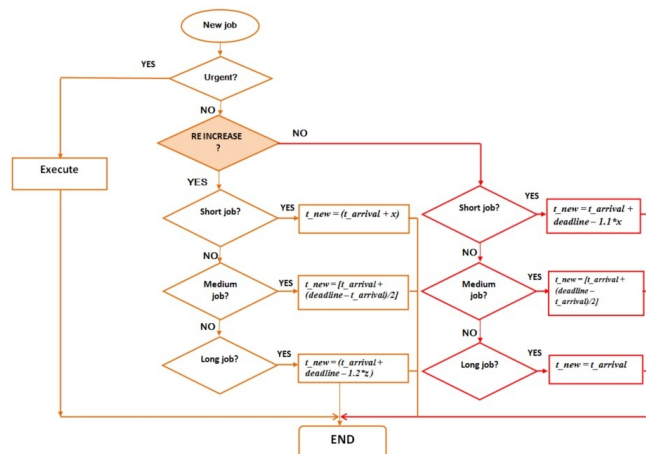

Figure 3: Workload scheduling algorithm.

The result of implementing this algorithm is illustrated in figure 4 . The energy consumption through 24 hours without using the workload scheduling algorithm is compared to the energy consumption after implementing this algorithm. The workload is intentionally modelled in higher intensity in the morning and in the evening to show the benefits of the algorithm. The results show 21% higher utilization of solar energy. More details on this algorithm can be found at article [5].

III.3 Energy Sources Scheduling Algorithm

The energy sources scheduling algorithm works in cooperation with the jobs scheduling algorithm described at section III.2 . Both algorithms are implemented in CloudSim simulator.

Based on prior studies on the field [6], [7], [8], [9] only two sources of energy are used, according to a priority scheme
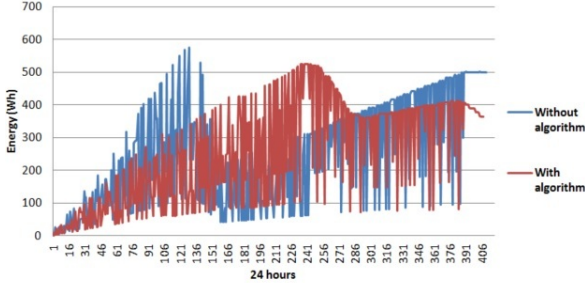
Figure 4: Energy consumption without and with implemented workload scheduling algorithm.

as given in Equation 1 .

$$Consum = RE + battery(+grid) \qquad (1)$$

where *Consum* is the energy consumption of the datacenter, *RE* represents renewable energy, *battery* is the energy drawn from battery and *grid* represents energy taken from the grid. First priority is given to renewable energy source, and battery is mainly used as the second source, alternatively combining with grid energy. We evaluate this scheme as not yet realistic and not optimal. The main reason is because: if only grid is used as a backup, high amount of grid energy is needed during times when renewable energy is lacking. If only battery is used a backup, we cannot yet switch to no grid energy systems when nowadays grid energy serves as main source of energy supplier in almost 100% of electric and electronic equippments. Furthermore, we mention 4 drawbacks of batteries to argument why using battery as a second source is not a good choice:

- High capacity battery is needed to compensate required energy during periods when renewable energy is lacking. This means higher costs of using batteries.

- Up to 30% of its produced energy is wasted due to AC/DC convertion.

- Batteries self - discharge.

- Batteries are toxic for the environment.

We propose a new priority scheduling scheme, where first priority is given to renewable energy, second priority to the grid energy, power capped dynamically, and third priority to the battery, as given in Equation 2 .

$$Consum = RE + grid_{\text{capped}} + battery \qquad (2)$$

The proposed scheme uses three priority levels for the different sources of energy. The aim is to prioritize renewable energy usage, in order to maximize its utilization which is equivalent to minimizing its waste. First priority is given to available renewable energy. Second, power from the grid is used if energy consumption is greater than the available quantity of renewable energy. However, dynamic power capping, a well-known technique on energy efficiency [10], is applied to the grid energy aiming to limit the power taken from the grid. The dynamic power capping factor is based on the difference between energy consumption and renewable energy. Table 1 describes how the power capping factor is set based on combinations between 3 levels of renewable energy and 4 levels of energy consumption.

Consumption / Renewable	1	2	3
1	2	1	1
2	3	2	1
3	4	3	2
4	4	4	3

Table 1: Power capping factor value based on combinations of energy consumption and renewable energy levels.
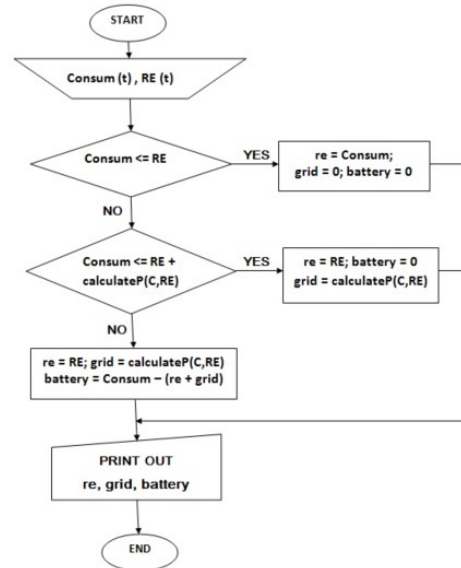

Figure 5: Energy sources scheduling algorithm.

Available renewable energy, which we assume to be known, is divided into 3 levels: 0-33% of its maximum generated

value belongs to level 1, 34%-66% of the maximum belongs to level 2 and 67% - 100% of the maximum belongs to level 3. Likewise, energy consumption, which we suppose it is known, is categorized into 4 levels: 1 means low energy consumption and 4 means very high energy consumption. The levels are set in segments of 0-25%, 26%-50%, 51%-75% and 76%-100% of the maximum value of daily energy consumption. The power capping factor is assigned a value from 1 to 4, accordingly, as illustrated at table 1 : higher is the gap between required energy and available renewable energy higher it is this value and vice versa. Higher power capping value means more power will be drawn from the grid. Dynamic power capping is already used for energy savings purpose in datacenters [10], [11], but it is never used, to our knowledge, in green powered datacenters for energy sources scheduling.

The energy sources scheduling algorithm is explained in details by the depicted flowchart given at figure 5 . *Consum* represents the energy consumption at a given time and *RE* is the available renewable energy at the same moment of time. Variables *re*, *grid*, and *battery* represent the amount of energy that is drawn from each of the energy sources to supply the datacenter. Given a certain amount of energy consumption and available renewable energy in a given moment of time *t*, first conducted test is to know whether the available renewable energy is enough to meet datacenter energy need. If yes, then all needed energy is taken from renewable source and grid energy and battery is assigned a value equal to 0. If energy consumption is higher than the available renewable energy, then power from grid will be taken. The amount to be drawn from it is calculated from a function named calculateP(C,RE) which assigns the value of power capping factor, according to the logic described at table 1 . If the energy drawn from both sources is not enough for the datacenter energy requirements then the battery will be used. The amount that will be drawn from it is defined by the difference between energy consumption and energy taken from renewable and grid sources. All the three sources are printed out to be used for illustrating and further ellaboration purpose.

IV.   Experiments and Results

The experiments aim to assess the result of applying the proposed scheduling algorithm to the energy quantity driven from each of the energy sources used to fulfill the energy requirements of the datacenter. Figure 6 represents the renewable energy utilization over total energy consumption through 24 hours of simulation. The horizontal axis represents 288 5-minutes time intervals of energy consumption

in blue and renewable energy shown in red, expressed in Wh unit. The total energy consumption is 120 kWh and the total renewable energy used is 90kWh. This figure is interconnected to figure 7 which illustrates the energy drawn from the grid and from the battery considering the same energy required for the datacenter. We can notice that renewable energy is fully used when it is available, during the day, while grid and battery are used during the night, when solar energy is lacking. It can be clearly seen from the graph that the grid power is capped at 4 levels and battery is used exactly during these periods when renewable energy and limited energy from the grid do not satisfy the need for energy.
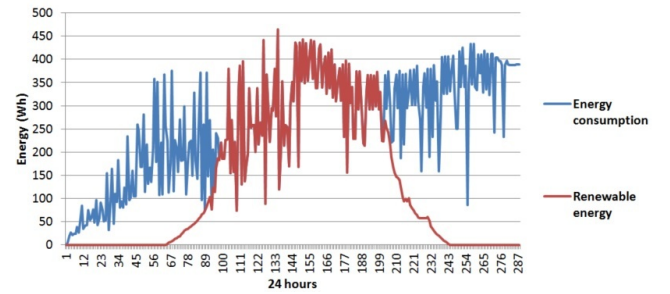

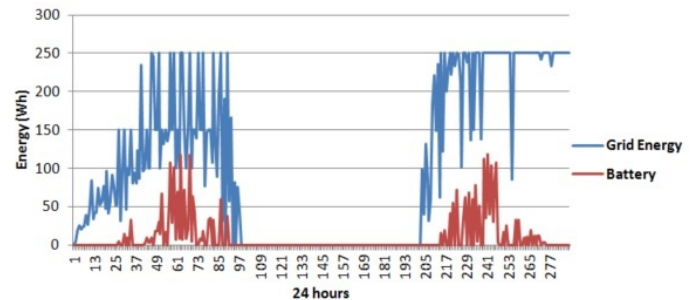*Figure 6: Renewable energy usage and datacenter energy consumption over 24 hours.*

Figure 7: Grid energy and battery usage over 24 hours.

Table 2 presents experiment results regarding the value and percentage of using these three energy sources. We intentionally chose a 75% renewable energy supply scenario, to explore the quantity that would be used from two other sources. The results show that out of 100% of energy consumption, 75% is drawn from the renewable energy source, 20% is taken from the grid and 5% is taken from battery.

Energy source	Renewable	Grid	Battery
Value(kWh)	90	25	5
Percentage(%)	75	20	5

Table 2: Value and percentage of energy sources utilization.

V. Conclusions

In this paper we present a new energy sources scheduling scheme in order to maximize the renewable energy utilization, and reduce energy drawn from the grid and batteries. First priority is given to renewable energy, second priority is given to grid energy and third one to batteries. A dynamic power technique is used for capping the energy used from the grid. In a 75% renewable energy coverage scenario, the results of the experiments show that 20% of the required energy is supplied by the grid and 5% is drawn from batteries. The advantage of this algorithm is that it is enough realistic to consider supplying the datacenter with energy from the grid, which is limited by implementing a dynamic power capping technique. On the other hand, we optimize the battery usage by encouraging lower capacity batteries.

The proposed algorithm has higher efficiency if it is implemented over a platform where renewable energy is efficiently and maximally exploited, e.g using a workload scheduling algorithm. Also, a precondition of this new algorithm to function is it assumes energy consumption and renewable energy are already known through prediction.

To conclude, we point out that the proposed scheme is a first prototype. Other elements should be taken in consideration in the future, like: the lifetime of the battery (number of cycles) and other power characteristics. Furthermore, the experiments will be extended to 2 days of simulation in order to monitor jobs that are postponed to the consecutive day.

Acknowledgment

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