# PaaS and IaaS layers optimization for energy-adaptive applications

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Abstract—

Data centres are power-hungry facilities that hosts ICT services and consumes up to 3% of all global electricity production. Consequently, in the last years, research trends in the field focused on mechanisms able to reduce the overall consumption of a data centre so as to reduce its energy footprint. Following such research outcomes, several data centre management frameworks started to implement energy efficiency policies. Such energy management techniques - with the help of other factors, such as the introduction of less power greedy CPUs - had a positive impact: a recent study showed that the energy consumption of data centres is actually less than the one previously predicted. However, from a research perspective, techniques for reducing energy consumption of virtualized infrastructures - such as server consolidation - are now well-known and not great breakthrough are expected. The introduction of new solutions, such as containers and platform as a service (PaaS) in cloud data-centres opens new challenges and opportunities. Moreover the new interest toward aspects such as green footprint, demands for more than just reducing energy consumption. Aiming at reducing energy consumption in data centres becomes part of a larger equation: being able to consume energy in a better way, prioritizing the consumption of green energies. In this paper we present the concept of Service Flexibility Agreement (SFA), an extension of the traditional SLA able to qualify the flexibility of applications deployed in a cloud environment. In particular, we detail preliminary models able to exploit this flexibility in order to increase the ratio of renewable energy consumed, notably in the case of local production (e.g. solar panels). Finally, we describe how the combination of PaaS and IaaS cloud layers provide the needed flexibility to support the SFA.

Keywords-Platform as a Service, Energy Management, Flexibility, Scalability

# I. INTRODUCTION

A recent study [9] showed that, while still growing, the energy consumption of data centres is growing at a slower pace than previously excepted. Electricity used in US data centres in 2010 was significantly lower than predicted by the EPAs 2007 report to Congress on data centres. There is a combination of factors explaining this slow down, among which the application of new energy policies in data centres. Consolidation techniques to reduce the power used by a given workload in a data centre, are nowadays adopted in several data centre and cloud management solutions. Research on how to improve Virtual Machines (VMs) consolidation and, consequently, reduce the energy consumption of a data centre it is not going to bring any big breakthrough. Nevertheless, societal challenges are

evolving. It is not only *how much* energy you consume to be important, but also *which* energy you consume. This is why we think the attention of researchers in the field of energy management in Cloud Computing should shift from the paradigm of "consume less" to the paradigm of "consume better". As important energy consumers, it is important that the energy management and policies of data centres prioritize the consumption of renewable energies over brown energies. However, the main problem with the utilization of renewable energies is that they are very variable in time. To adapt to such energies, we need to adapt and shift the workload of applications. This means reducing the workload when there is less renewable energies available, for example.

Beyond that, the technological landscape is changing. Data centre host more than simple virtual machines. New "virtualization" techniques such as containers are appearing on the scene, and Platform-as-a-Service solutions are more and more used on top of Infrastructure-as-a-Service solutions. PaaS management frameworks models the architecture of applications and provide management function to scale up and down multi-tier applications. Some frameworks allow to automatize this process: Cloudify<sup>1</sup>, for example, provides a language for auto-scaling. This language defines Key Performance Indicators (KPIs) and thresholds that will trigger the scaling operations. For example, in the case of a 3-tier Web server application, it is possible to describe that if the latency in serving the pages goes over a certain threshold, a new front-end VM should be launched. As such, the "intelligence" of PaaS management frameworks can be easily employed for apply energy management policies taking into account application SLAs and their architecture.

In line with the above reasoning, we believe that the combined management of PaaS and IaaS may bring new opportunities in energy policies management.

However, when it comes to the adaptation of applications workload to the availability of the renewable energies, we think that a piece is missing. Indeed, currently the PaaS framework has no way to lower or postpone workload in a reasonable way when there is no renewable energy or energy is too expensive, for instance. We believe that the PaaS models can be enhanced to better describe the flexibility of applications. This would allow to perform optimizations at data centre level, such as increasing the renewable energy

<sup>&</sup>lt;sup>1</sup>http://www.gigaspaces.com/cloudify-cloud-orchestration/overview

usage.

Thus, in this paper we propose the concept of Service Flexibility Agreement (SFA). The SFA is an extended Service Level Agreement (SLA): it includes a description of the flexibility of an application. While, the SLA usually defines only minimum levels of resources that an application should be guaranteed to have, in the context of flexible applications, this is not enough: some applications can accept to have a temporarily reduced performance or shifted activities. Similarly, some applications would benefit from a temporary increase of allocation of resources when renewable energies are available. The SFA defines a simple interface to describe this flexibility in term or resource adopted over the time. Thanks to the SFA, an energy-aware PaaS framework is able to dynamically reconfigure applications or single layers (e.g. scale-up and down) to comply with a given energy budget (e.g. the amount of green energy available at a given moment in time). Finally, changes occurred at the level of the PaaS framework can be exploited by an underlying IaaS framework: an improved information sharing between the two can improve the energy usage.

## II. SERVICE FLEXIBILITY AGREEMENT

In current PaaS architectures, the framework grants a certain flexibility to applications. For example, an application <sup>2</sup> can ask the PaaS framework to spawn more or less VMs <sup>3</sup> or Linux containers <sup>2</sup> according to its needs. However, the <sup>4</sup> flexibility is entirely controlled by the application and/or the <sup>5</sup> application owner. The intuition behind SFA is to delegate <sup>6</sup> some of the flexibility control to the PaaS framework while <sup>7</sup> still guaranteeing the end user satisfaction. With respect to <sup>8</sup> a traditional SLA, the SFA adds a few new dimensions: the <sup>9</sup> possibility for the required resources to vary in time, plus the <sup>10</sup> possibility to qualify violations of the required performance. <sup>11</sup>

As shown in listing 1 and also represented graphically in 12 figure 1, for each time frame of a day the SFA defines a 13 recommended business performance (RecoBP, in red in the 14 figure). The business performance is one of the KPIs of the 15 application. For example, for a Web server it is the number 16 of pages served per minutes, for a video transcoding service 17 it will be how many videos can be transcoded per minutes. 18

We then define a concept called "Happy points", noted <sup>19</sup> "H". This is an abstraction of the end-user satisfaction. <sup>20</sup> An application having zero Happy points means that the <sup>21</sup> end user is reasonably satisfied. An application being allocated exactly the number of resources corresponding to the RecoBP collects 0 Happy points. This situation corresponds to the traditional SLA threshold. The positive and negative deviations (PosDev and NegDev) declared in the SFA are then the way that each application "reacts" to being given more or less resources than the RecoBP. Indeed, some applications such as video transcoding can benefit

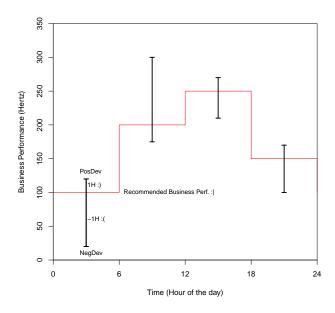


Figure 1: Service Flexibility Agreement representation

```
SFA:
   Start: 00:00
    End: 06:00
    RecoBP: 100 Hz
    PosDev: 100 Hz/H
    NegDev: 50 Hz/H
   Start: 07:00
    End: 12:00
    RecoBP: 300 Hz
    PosDev: 50 Hz/H
    NegDev: 200 Hz/H
WorkingModes:
  - WMName: WM1
    actuator: 'cf scale myApp -i 3'
    defaultPower: '300 W'
    maxBusinessPerf: '100 Hz'
   WMName: WM2
    actuator: 'cf scale myApp -i 5'
    defaultPower: '500 W'
    maxBusinessPerf: '150 Hz'
```

Listing 1: SFA example

from receiving temporarily more resources because they can process more videos and thus make their end user happier. This kind of application reacts linearly to the amount of resources it is allocated. On the other hand, an application such as a web server typically have a "turning point" in their relation between performance and resources. Indeed,

<sup>&</sup>lt;sup>2</sup>http://docs.cloudfoundry.org/concepts/architecture/warden.html

giving them less that a certain level of resources (such as the number of front-end VMs) will start to augment the latency in delivering web pages, thus making the end-user unhappy. On the contrary, giving them more than that level of resources will not have any perceptible impact on the end user, as the latency is already small. This is represented by the vertical deviation bars in figure 1: the length of the bar represents the amount of Happy points that the application will win/lose when given more/less performance than the recoBP, respectively. In this example, at 10 Oclock, if the PaaS framework allocates the resource corresponding to the recommended business performance of 200Hz, the application will collect 0 Happy points. If the application gets 300Hz, it will get 1H, and one more Happy point for each 100Hz above that. Conversely, if it gets less than the recommended 200Hz, it will loose Happy point at the rate of one happy point per 25Hz.

We further define the various Working Modes (WM) of an application. A WM corresponds to a set of resources allocated by the PaaS to an application. We associate to each WM its typical power consumption and the maximum business performance it can offer. In practice, a WM corresponds to a number of VMs or Linux Containers, each running instances of the application. Using the SFA, it is now possible to compute the number of Happy points provided by each WM for each time slot.

## III. INTERACTION AMONG IAAS AND PAAS LAYERS

In recent PaaS frameworks, application scaling is performed by launching more containers. Each container is an instance, or worker, of the application. Containers run in a VM, controlled by an underlying IaaS framework. To save energy, those VMs are traditionally consolidated on a part of the servers of the data centre, which permits to switch off unused servers and thus save energy. Using the SFA, it is now possible to predict the amount of resource that an application will need, together with the possible deviations. This will allow to optimize VMs by placing containers in them and consequently optimize servers by placing VMs where containers are hosted. VMs an containers movements should be minimized to preserve the energy efficiency. However to achieve this we need to enhance the interaction between the IaaS and PaaS. There are essentially two types of information that need to be exchanged:

- VMs grouping
- VMs life-time

The PaaS layer has a certain degree of knowledge about the architecture of deployed applications. If an application is composed of several containers forming the different layers, it is beneficial to keep them together on the same VMs as much as possible, because they will probably have the same life cycle. Those containers will probably exchange a lot of information among them. Furthermore, they will be switched off together when the application is terminated. This justifies

to keep them together on the same VM or group of VMs as much as possible. Furthermore, the affinity between VMs is an information that could be transmitted to the IaaS when a PaaS manager asks for VMs creation during application deployment.

The container life-time determines the VMs lifetime. Thus it is another information that is worth to be shared among PaaS to the IaaS layer. Computing the VM life-time, i.e. an estimated duration that the VM will be kept running before being switched off, is important for the IaaS layer when optimizing the energy consumption of a data centre through VM consolidation: indeed to switch off a server it is necessary to migrate all VMs running on that server. However, migrating a VM is an investment, and if the VM is about to be terminated by the PaaS layer, this investment is lost. Of course, the IaaS layer shouldn't be aware of the applications that are running in the data centre, as it is not its role and would furthermore break the separation of concerns between the IaaS and the PaaS. The two proposed information transmission (VMs grouping and VMs life-time) does not break the separation of concerns between IaaS and PaaS, because they are expressed in terms of the IaaS VMs only: at IaaS level no knowledge of the running applications should be necessary.

## IV. DESIGN & OPTIMIZATION

The SFA is used in the communication between an application and the underlying PaaS framework (while the SLA, on the contrary, is used for the communication between the data centre and its clients), as shown in figure 2.

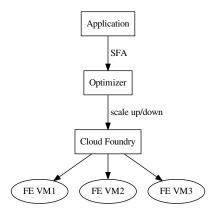


Figure 2: SFA block diagram

In practice, we add a component in the Cloud Foundry stack called the "Optimizer". This component accepts commands from the application load balancer. Instead of just scale-up/scale-down commands as it is the case currently, we include a recommended scaling level, together with a positive deviation and a negative deviation, as described in Section II. This will let the Optimizer to optimize according to multiple criteria: 1) the energy consumption in the data

centre, 2) the global happiness of the applications (the sum of all happy points granted to applications) and finally 3) the usage of renewable energies.

#### V. RELATED WORKS

Workload consolidation is a powerful means to improve IT efficiency and reduce power consumption. VM consolidation approaches to reduce energy consumption at IaaS layer have been explored in many recent papers [2] [7] [10] [8] [11] [12] [6].

In addition, there are energy efficient solutions based on scaling operations (scale up/down application) based on applications performance metrics. Although these proposals reduce the energy footprint of applications and cloud infrastructures, they do not model the applications performance trend to finely define a trade-off between applications Quality of Service and energy footprint.

Autonomic Computing has been exploited in the design of cloud computing architectures in order to devise autonomic loops aiming at providing coordinated actions among cloud layers for efficiency measures, turning each layer of the cloud stack more autonomous, adaptable and aware of the runtime environment [1] [5] [4].

In order to reach a global and efficient state due to conflicting objectives, autonomic loops need to be synchronized. In [1], authors proposed a generic model to synchronize and coordinate autonomic loops in cloud computing stack. The feasibility and scalability of their approach is evaluated via simulation-based experiments on the interaction of several self-adaptive applications with a common self-adaptive infrastructure.

In addition to elasticity, scalability is another major advantage introduced by the cloud paradigm. In [13], automated application scalability in cloud environments are presented. Authors highlight challenges that will likely be addressed in new research efforts and present an ideal scalable cloud system.

[3] proposes a co-design of IaaS and PaaS layers for energy optimization in the cloud. The paper outlines the design of interfaces to enable cross-layer cooperation in clouds. This position paper claims that significant energy gains could be obtained by creating a cooperation API between the IaaS layer and the PaaS layer. Authors discuss two complementary approaches for establishing such cooperation: cross-layer information sharing, and cross-layer coordination.

## VI. CONCLUSION AND FUTURE WORK

The PaaS Cloud paradigm and the corresponding frameworks are currently developing at high-speed. As shown in this paper, they provide new opportunities for energy optimization. We presented the SFA, a concept able to describe the flexibility of applications. This format includes the trade-off between the amount of resources allocated to a

PaaS scalable application, the resulting performance and the corresponding user experience, in a simple way. This allows the PaaS framework to perform multi-criteria optimizations such as lowering the global energy consumption of the data centre, using more renewable energies and increasing the application user satisfaction. As future work, we will design the proposed API and components within the Cloud Foundry framework.

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