

A Review of Comparative Study of Serverless Computing and Virtual Machines in Cloud Environments

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Abstract - Two important paradigms of cloud computing are serverless computing and virtual machines (VMs), which have advantages and tradeoffs to deploy modern applications. A systematic, comparative analysis from the aspects of architecture, performance, cost-efficiency, scalability, security and workload suitability for serverless computing and VMs in cloud environment is conducted in this review paper. We first provide definition and illustration of serverless computing (such as eventdriven Function-as-a-Service models) and VMs (such as hypervisorbased virtualization) along with description of their own strengths and weaknesses. Major discoveries point out that serverless computing presents itself best for high scalability scenarios, low management overheads, and pay per use cost models and is fit for event driven microservices and workloads with short duration. On the other hand, VMs offer greater control of the infrastructure, and good compatibility with legacy systems and consistent performances for long running applications, at a cost of increased resource cost and higher management complexity. The paper presents context specific tradeoffs and use case through real world case studies (e.g., AWS Lambda vs EC2 instance). Serverless cold starts, VM resource underutilization and vendor lock in are been critically examined. Future directions are discussed with emerging trends such as hybrid architectures, and AI driven resource optimization. Finally, the review makes actionable recommendations for practitioners on how to choose an optimal model among the offered models based on the workload characteristics and specific cost and scalability demands. Motivated by this goal, we present a synthesis of information to help practitioners in the clouds, and the researchers that are beginning to study them, understand the potential roles that this emerging technology may play in the near future, and what those roles imply for the development of next generation applications.

Key Words: Serverless computing, Virtual Machines (VMs), Cloud computing, FaaS, IaaS, Scalability, Cost-efficiency, Comparative analysis.

1.INTRODUCTION

1.1 Background and Context

The cloud computing has disrupted businesses by allowing them to leverage scalable and on demand

services over the internet instead of relying on existing on premises infrastructures. Cloud computing started from the turn of the century when virtualization technologies powered the evolution of cloud computing as well through the use of virtual machines (VM). As the time progressed, cloud models like Infrastructure-as-a-Service (IaaS), Platform-as-a-Service (PaaS), and Software-as-a-Service (SaaS) were developed based on different level of abstraction and control. Today, serverless computing (Function as a Service, or FaaS) has arrived - infrastructure management being abstracted exactly while developers are not allowed to concentrate on the execution of code. In cloud, resource management and deployment plays an important role, economic cost, scalability, and operational efficiency directly depend on it.

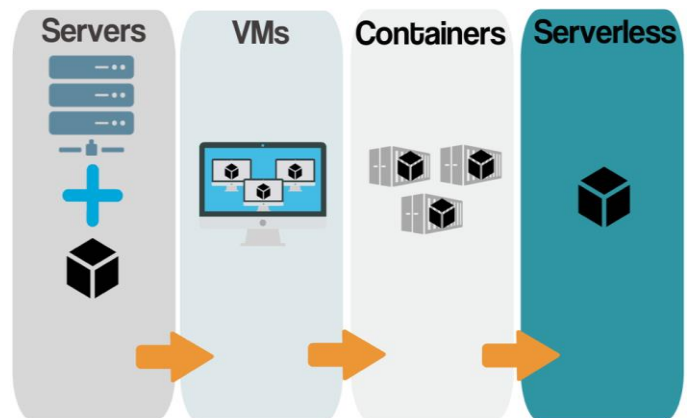


Figure-1: Server vs VMs vs Serverless.

1.2 Problem Statement

Manual scaling and maintenance of these traditional cloud computing models such as VM based architectures cause resource underuse, over provisioning as well as high operational overhead. On the one hand, VMs are flexible but tend to find fulfilling the needs of dynamic, event driven workloads difficult. However, serverless computing claims to alleviate the hassle of scaling through automatic scaling as well as cost efficiency; but casts limitations including limited control of runtime, and latency concerns (e.g, starting from cold). To help organizations select the best of the solutions for different workloads, it is imperative to evaluate these paradigms systematically.

1.3 Objectives of the Study

The aim of this paper is to compare serverless computing, with virtual machines (VM) in cloud environment on architectural, performance metrics, cost models and scalability mechanisms. In this way, it will analyze each approach's strengths, for instance, serverless computing's pay per use pricing and the ability to control infrastructure in VMs, as well as its weaknesses, like serverless cold starts and VM resource waste. Further, the paper will investigate various use cases for when each model is most appropriate, e.g. serving microservices using serverless computing or VMs for legacy applications.

1.4.Scope of the Paper

The study focuses on four key evaluation criteria:

- Performance: Latency, throughput, and resource utilization.
- Cost: Pricing models (e.g., pay-per-use vs. reserved instances).
- Scalability: Horizontal vs. vertical scaling, auto-scaling efficiency.
- Ease of Use: Developer experience, deployment complexity, and monitoring tools.

Aspects like security and compliance are acknowledged but not deeply explored.

2.OVERVIEW OF SERVERLESS COMPUTING

2.1 Definition and Key Concepts

Serverless computing is a cloud execution model where servers do not need to be managed by the developer; instead code running in the form of individual functions is deployed on the cloud. Although the term 'serverless' is a bit misleading as the servers are still involved, the cloud provider fully abstracts the provisioning, scaling, and maintenance of these servers. Serverless computing key concepts are: Event-Driven Architecture which means that functions are triggered based on events coming from HTTP requests, database update, uploaded file, or messages from a message queue and Function-as-a-Service (FaaS) to allow code execution in stateless, ephemeral containers. In FaaS platforms such as AWS Lambda and Azure Functions, the users get charged only for the compute time spent while executing.

2.2.Architecture of Serverless Computing

Any serverless architecture would be made up of three primary components, the API Gateway, the FaaS platform, and the Backend services. It receives external requests as entry point, routes them to the appropriate functions

while handling onboarding, throttling, and logging. Functions can be hosted and executed on the FaaS Platform on top of dynamically allocated resources, scaled instances, and idle containers can be terminated as needed. The functions call upon some backend services (e.g., DynamoDB databases, S3 storage, Kafka messaging queues) to perform their work. A serverless function, for example, may be triggered when an image is uploaded to a cloud storage bucket and it generates a thumbnail that is stored in another (different) bucket.

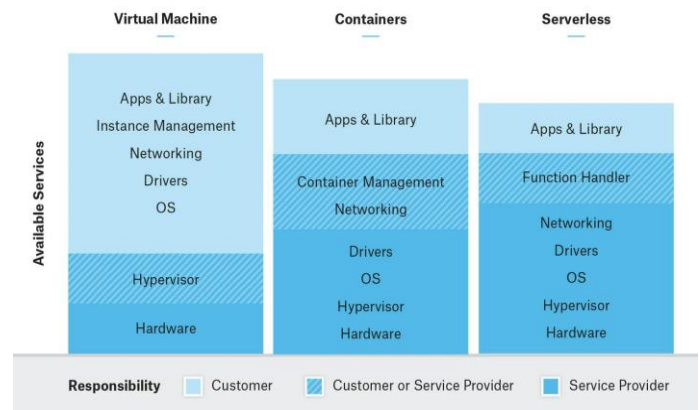


Figure-2:Architecture of Serverless Computing

2.3.Advantages

Since serverless computing is essentially a means to run your ba see on someone else's servers, it is scalable, cost efficient, and much less operational overhead (compared to a traditional app). With automatic horizontal scaling, it automatically scales horizontally at high scale with minimal or no intervention whether you receive a few dozen requests to a few thousand requests per second. Pay per execution pricing model is very cost effective as there are no costs in idle periods and best suited for sporadic or unpredictable workloads. However, serverless computing also declines the operational overhead as developers write code only for the what needs to be written, while the cloud provider does the rest, provisioning servers, patching, and they are always on.

2.4.Limitations

However, vendor lock in, no control over the infrastructure and cold start issues are some of the drawbacks of serverless computing. Depending on the function, there can also be a cold start delay, when the function has been inactive at some point and hence the platform needs to provision resources before execution of these functions. Vendor lock in is also an issue due to tighter integration from the ecosystem of the provider (for example, AWS specific triggers) which make it hard to migrate to other platforms. In addition, there isn't much a developer can do to influence the underlying infrastructure to such an extent where OS configurations,

runtime versions, and hardware can be better tuned to make the workloads optimized for specific use cases.

3.OVERVIEW OF VIRTUAL MACHINES (VMS)

3.1 Definition and Key Concepts

Virtual Machines (VM) is a software emulation of physical computers which allows us to run multiple individual separate OS on same physical host. This is possible due to the process called virtualization which takes the physical hardware resource like CPU, memory, and storage and allocates them in virtual environments. The hypervisors are the key concepts in VM technology, because they use software or firmware to create, manage and allocate the resources for the VMs. The two hypervisor types available are: Type 1 (Bare Metal) hypervisor that runs on the host hardware (i.e., VMware ESXi, Microsoft Hyper-V), and Type 2 (Hosted) type of hypervisor that runs on top of a host OS (i.e., Oracle VirtualBox, VMware Workstation). In addition, Infrastructure as a Service (IaaS) is the cloud model where service providers (e.g., AWS EC2, Azure VMs) offer virtualized computing server, virtualized CPU (vCPU) to the users, VMs on demand, and will pay the cost associated with the resources that are allocated (RAM, vCPU, Storage).

3.2.Architecture of VMs

The rest of this paper describes a VM architecture composed of three core components which include the hypervisor, guest OS, and the resource allocation. The hypervisor allocates the physical host resources among the virtualized pools and then carefully partitions them into isolated pools of resources for VMs, also selectively managing the affiliation between them to prevent interference. Operating system of each VM, independent of host OS or other VM, the operating system the guest OS, which applications run in a self contained environment. Resource allocation means that the hypervisor can provide dynamic resource allocation for CPU cores, memory, disk space to the VM, based on specific configurations or current demand. A physical server with 4 CPU cores and 16GB of RAM would be able to run 4 VMs, using 4 cores and 16GB of RAM per VM. In each VM, a different OS such as Ubuntu, CentOS or Windows Server could be run, and it could be supporting different applications.

3.3 Advantages

Its virtual machines provide full control environment, flexibility and compatibility advantages. Users have total control over the OS configurations; they can install the programs, adjust hardware settings, such as CPU prioritization, and memory allocation. Just like VMS, the VMs are also very flexible and can support a wide variety of workloads, from legacy apps that need a specific OS version or a proprietary software environment. VMs also

emulate standard x86/ARM architectures for compatibility and ease of moving (lift and shift) onpremise workloads to the cloud.

4.COMPARATIVE ANALYSIS

In this section, six dimensions — performance, cost, scalability, ease of use & security are compared between serverless computing and virtual machines (VMs).

4.1.Performance

Latency, throughput and resource utilization are the clear differences when comparing serverless computing with Virtual Machines (VMs). Cold start latency: Serverless computing's latency comes from function instances taking anywhere from hundreds of milliseconds to seconds to start, which exacerbates the delay after non-activity by that amount of time, although from there the response times are much faster. But while VMs have a consistent latency since they stay running, they still cold starts, so different than a live system in a real world topology there would be some with variability, other times network or even storage bottlenecks in shared physical hosts. Another performance consideration serverless brings is horizontal scaling: since instant you can scale up the number of instances that are used to execute your function, however, there are limits to the amount of throughput you can obtain from a function instance (e.g., AWS Lambda limits its functions to 15 minutes of execution). Long running tasks, such as batch processing, benefit better from VMs, however, VMs need to be manually scaled to handle traffic spikes, while on the other hand VMs provide higher sustained throughput and better isolation. Serverless computing efficiently utilizes the resource by dynamically allocating compute power during the function execution time and thus so less idle time. However, far from achieving efficiency, VMs very often suffer from resource underutilization, where allocated resources such as 8GB RAM is only used a part (e.g., 2GB), wasting the excess capacity.

4.2.Cost

Regarding pricing models, serverless computing employs a pay-per-execution model where resources consume and are billed per compute second and allocated memory (e.g. AWS Lambda charges on a per millisecond of compute), thus regarding total cost of ownership becomes an important factor. It would be the perfect model for sporadic workloads. However, VMs tend to follow a pay as you go or reserved instance pricing model, where users are charged for the allocated resources such as CPU and memory on the hourly basis (e.g AWS EC2 charges per hour irrespective of usage). For low-to-moderate traffic applications (APIs or event triggers) serverless computing is economical, but for high throughput, long running tasks for instance video encoding there is high cost. However,

VMs are not cost effective when workloads are predictable, constant, for example a database, but are not cost effective due to oversupplying resources for irregular demand. In the case of a weather API serving 10,000 daily requests, serverless can cost \$5 per month for the API versus \$50 for a VM running all the time.

4.3. Scalability

Serverless computing automatically scales horizontally by creating many parallel function instances to fulfill fluctuating workloads but not vertically, the change of CPU or memory behavior at runtime. Thanks to VMs, vertical and horizontal scaling is automatic, but manual horizontal scaling is needed by means of load balancers or auto-scaling groups, and vertical scaling involves upgrading the VM specs, which in most cases implies downtime. On auto-scaling, serverless' scaling services are granular and built into the platform for example per request scaling on Azure Functions so adding workload can be scaled in real time without interruption. Serverless are VMs, too, but they offer auto scaling (AWS EC2 Auto Scaling) which is brought up through configuration and it may lag behind the actual demand time.

4.4. Security

Serverless computing isolates functions into containers but sharing of backend services (such as databases) is a shared tenancy, which brings risks. However, unlike VMs, hypervisors in VMs offer strong isolation in the form of virtual machines wherein the risk of cross VM attacks is greatly reduced. Serverless inherently trusts provider's security measures (AWS IAM roles) and its data is exposed through payloads of event. Conversely, while VMs give us full control over the encryption, firewalls, and access policies there is a greater level of security compared to ISVs. But where serverless has some limited visibility into the compliance of the underlying infrastructure with standards such as HIPAA or GDPR is in terms of compliance. Whereas VMs are more intelligible and can be more easily audited as well as customised to conform to specific regulatory needs, thus more control on the compliance.

5. CASE STUDIES AND REAL-WORLD APPLICATIONS

In this section we study practical implementations of serverless computing and VMs in big cloud vendors and analyze their practical results.

5.1. Serverless Computing in Industry

Major companies use AWS Lambda, Azure Functions and Google Cloud Functions for many use cases. AWS Lambda is being used by Netflix for real time event processing such as encoding validation and personalised

recommendations, and save 80% operational cost from using EC2 instances. This was however mitigated with provisioned concurrency in all but cold starts during low traffic times. For IoT based supply chain monitoring, Maersk uses Azure Functions to process sensor data from a shipping container, triggering alerts with scalability to receive over 10,000 concurrent events during peak operations. Otherwise, debugging distributed functions was a challenge they overcame by way of integration with Application Insights. Twitter (now X), uses Google Cloud Functions for auto moderation of the user generated content, saving money by using pay per use pricing compared to dedicated VMs. Functions were deployed regionally to solve the latency spikes challenge during viral events.

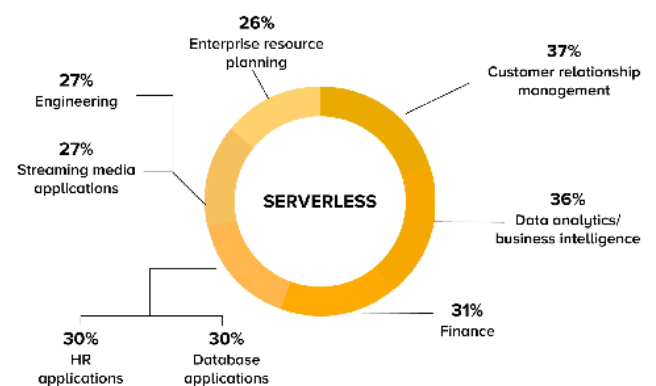


Figure-3: Serverless Computing in Industry

5.2. Virtual Machines in Industry

Having major companies employ AWS EC2, Azure VMs, and Google Compute Engine (GCE) to run critical applications is incredibly widespread. For its core reservation system and PostgreSQL databases, Airbnb uses EC2 instances which it deploys reserved instances to guarantee performance on the high availability workloads. A full setup control over database tuning, such as query optimization, or indexing, however with over-provisioning we were getting 30% of the resources before using AWS Auto Scaling. Azure VMs, the GPU optimized NVv4 series instances, are used by GE Healthcare for processing medical imaging and means of running AI models on MRI/CT scans and provides benefit from HIPAA compliant VM's. As a consequence, a partial migration to Azure Kubernetes Service (AKS) was done partly because of high costs for 24/7 uptime for VMs. Spotify deploys its music recommendation engine on top of Google Compute Engine, and uses preemptible VMs to run batch processing over the user listening patterns. While interruptible instances yield cost savings of 70%, they require job restarts in case of VM preemptions, which necessitates the implementation of checkpointing workflows for job continuity.

5.3. Comparative Analysis of Case Studies

Furthermore, key insights from the implementations of serverless computing and VMs focus on the major differences in terms of performance, cost, scalability, level of operational complexity and the use of the hybrid approach. Serverless performs well for event driven tasks that is just what Netflix and Maersk saw but it struggled with latency critical workflows such as Twitter. However, while VMs offered very stable performance for long-running processes like Airbnb reservation system or GE Healthcare's medical imaging, they were inefficient in how they allocated resources. Serverless was affordable for the fits and starts of Netflix's encoding checks but expensive for the high throughput of Twitter's peak traffic moderation. Spotify's batch jobs were VMs which were economical in a steady state, but caused resource waste in the absence of auto-scaling as with Airbnb's early setup. Serverless had no trouble with scaling traffic spikes automatically (Maersk's IoT events), whereas VMs required manual intervention to dynamic scaling (Airbnb); or hybrid architectures (GE Healthcare migrating its VM applications to AKS). Serverless reduced the DevOps effort as in Netflix but it brought the debugging issue with it, similar to Maersk's distributed functions. Spotify's couponing needed expertise in infrastructure management as its VMs, whereas GE Healthcare's HIPAA compliance needed granular control as its VMs. Finally, Hybrid Approaches: companies like Airbnb and GE Healthcare followed a hybrid approach, with serverless being used for edge tasks (e.g. for log analysis Lambda is used) and VMs for core systems (e.g., databases are run on EC2).

6. CONCLUSION

Comparing serverless computing and virtual machines (VMs) in the cloud discloses complementing as well as contrasting qualities inherent in both concepts. Serverless computing specifically suits event-driven architectures, microservices, and shorten lived tasks since it excels at rapid scalability, cost efficiency to sporadic workloads and lower overhead. Nevertheless, cold start latency, lack of runtime control, and vendor lock in can hamper its application in latency sensitive or long running application. However, VMs offer complete flexibility, complete control over infrastructure and compatibility with legacy systems, which are well suited for steady state workloads, for high performance computing, or for regulated environments. However, without manual intervention, VMs are often resource underutilized, constant operational costs, and scalability suffer. Ultimately, which option — serverless or VMs — presents the correct approach depends on the characteristics of workload, the cost considerations and organizational priorities.

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