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Research Article



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The Serverless Paradigm: Abstraction, Elasticity, and Event-Driven Computing in Modern Cloud Architectures

Ujjwal Raj*

Independent Researcher, USA

* Corresponding Author Email: reachujjwalraj@gmail.com- ORCID: 0000-0002-5247-0050

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Abstract:

Serverless computing has emerged as a transformative paradigm in cloud computing, fundamentally altering how applications are designed, deployed, and managed. This article explores the core characteristics of serverless architectures—including infrastructure abstraction, event-driven execution models, automatic scaling, and consumption-based billing while distinguishing them from traditional cloud service models. The article demonstrates the significant benefits of serverless adoption, such as reduced operational overhead, accelerated development cycles, and enhanced cost efficiency, particularly for workloads with unpredictable demand patterns. It examines architectural patterns naturally suited to serverless implementation, including microservices integration, event-driven designs, and data processing pipelines. The analysis also addresses critical challenges inherent to the serverless model, including cold start latency, observability complexities, vendor lock-in concerns, and state management in stateless environments. The article concludes with an evaluation of the current serverless landscape across major cloud providers and identifies promising future directions, including convergence with edge computing and artificial intelligence technologies.

1. Introduction and Foundational Principles

Serverless computing represents a paradigm shift in cloud computing that fundamentally transforms application deployment and management strategies. This approach, often termed Function-as-a-Service (FaaS), enables developers to focus exclusively on functionality abstracting away while infrastructure management concerns [1]. The serverless model emerged as a natural evolution in cloud computing, progressing from Infrastructureas-a-Service (IaaS) and Platform-as-a-Service (PaaS) to deliver heightened abstraction and operational efficiency. Recent industry surveys indicate substantial growth in serverless adoption, with a significant percentage of enterprises now implementing serverless technologies in at least one application [1]. This trajectory reflects the model's compelling value proposition across diverse organizational contexts. Historically, the serverless concept materialized commercially in 2014 with AWS Lambda, though its conceptual foundations trace back to utility computing theories proposed in the early 2000s. By 2024, the serverless computing

market has reached substantial valuation, with projections indicating continued strong growth through 2028 [2]. The serverless paradigm is distinguished by four fundamental characteristics that collectively define its operational model:

Server abstraction removes infrastructure provisioning and management responsibilities from developers, with adopters reporting significant reductions in operational overhead [1].

Event-driven execution model, where functions activate in response to specific triggers such as HTTP requests, database changes, or message queue events. This approach has demonstrated notable improvements in resource utilization compared to traditional always-on deployment models [2].

Automatic and elastic scaling enables seamless adaptation to workload fluctuations without manual intervention. Cloud providers' serverless platforms automatically provision computational resources in response to incoming requests, with platforms like AWS Lambda reporting the ability to scale from zero to thousands of concurrent executions within seconds.

Consumption-based billing charges exclusively for actual compute resources consumed during function execution, typically measured in millisecond increments, eliminating costs during idle periods. Studies indicate this billing approach reduces compute costs significantly for intermittent workloads compared to traditional reservation-based models [1].

Serverless computing distinctly differs from preceding cloud service models in its abstraction level and operational parameters. Unlike IaaS, which requires manual virtual machine configuration serverless maintenance. and completely abstracts infrastructure management. It extends beyond PaaS by eliminating applicationlevel scaling concerns and introducing more granular billing. Compared to container orchestration platforms like Kubernetes, which still necessitate cluster management and scaling policies, serverless platforms provide automatic configuration scaling without requirements. Comparative analyses demonstrate that serverless significantly implementations require fewer operational hours than container-based deployments and traditional IaaS approaches [2].

2. Benefits and Value Proposition

2.1 Operational Efficiency

Serverless computing delivers substantial operational benefits radically reducing by infrastructure management overhead. Organizations implementing serverless architectures significant reductions in DevOps personnel hours dedicated to server provisioning, patching, and maintenance activities [3]. Studies of enterprise implementations reveal that development teams reclaim considerable time previously allocated to infrastructure management tasks, representing a meaningful portion of total development capacity [3]. This operational efficiency translates directly to financial benefits, with organizations reporting reductions in total cost of ownership (TCO) serverless adoption. Infrastructure following automation inherent in serverless platforms has eliminated many security vulnerabilities stemming from misconfiguration and patch management delays, addressing key concerns that previously consumed substantial operational resources [4].

2.2 Development Acceleration

Development acceleration represents another significant advantage of serverless architectures. The abstraction of infrastructure concerns enables developers to focus exclusively on business logic, reducing cognitive load and supporting faster

iteration cycles. Industry analyses show that development teams leveraging serverless frameworks demonstrate measurable reductions in time-to-production for new features compared to utilizing deployment teams traditional methodologies [3]. This acceleration stems from deployment simplified processes, with organizations reporting increased deployment frequency following serverless adoption. The elimination of environment configuration disparities between development and production has reduced integration issues, while serverless frameworks' built-in CI/CD integration capabilities have compressed deployment pipelines [4]. Many organizations report that serverless adoption enabled them to decrease time-to-market for new products by months on average [3].

2.3 Cost Efficiency

Cost efficiency constitutes a primary driver for serverless adoption across diverse organizational contexts. The consumption-based pricing model eliminates costs during idle periods, organizations reporting infrastructure expenditure reductions for workloads with lower utilization rates [3]. This economic advantage is particularly pronounced for applications with unpredictable or sporadic traffic patterns. Analyses of enterprise workloads reveal that applications with high variability in request rates achieved significant cost reductions through serverless implementation compared to traditional provisioning [4]. Even for sustained workloads, the elimination of overprovisioning - which is common in traditional architectures according to industry benchmarks delivers significant economic benefits. The payper-use model also transforms capital expenditure (CapEx) to operational expenditure (OpEx), with enterprises reporting improved financial flexibility and more predictable cost structures despite workload variability [3].

2.4 Scalability

Scalability characteristics represent perhaps the transformative aspect of serverless architectures. The automatic, near-instantaneous scaling capabilities eliminate capacity planning requirements and enable seamless handling of fluctuations without performance degradation. Performance benchmarks demonstrate that leading serverless platforms can scale from zero to thousands of concurrent function executions within seconds, accommodating sudden traffic overwhelm spikes that would traditional architectures [4]. This elastic scaling occurs bidirectionally, with resources scaling down to zero during idle periods, unlike container orchestration systems that maintain minimum resource allocations. Analysis of production workloads reveals that serverless implementations maintain high availability during traffic surges, compared to traditional autoscaling groups with similar configurations [3]. For seasonal workloads with significant differences between peak and baseline traffic, serverless architectures demonstrate high cost efficiency (defined as the ratio of resources consumed to resources provisioned), compared to traditional provisioning approaches [4].

3. Architectural Patterns and Implementation Strategies

Serverless computing has catalyzed significant evolution in microservices integration and decomposition approaches, enabling granular functional separation than traditional microservice architectures. Research conducted across enterprise applications indicates serverless implementations achieve substantially granularity function higher compared conventional microservices [5]. This fine-grained decomposition enables superior isolation, with failure domain analysis demonstrating reduced cascading failures following decomposition from microservices to serverless functions. Organizations implementing serverless microservices report reductions in time required for individual service updates, with many teams achieving continuous deployment capabilities within months of adoption [6].

Domain-driven design methodologies complemented by serverless architectures have demonstrated particularly compelling results, with context implementations bounded showing improvements in team autonomy metrics and reduced cross-team dependencies compared to monolithic coarse-grained microservice or approaches [5]. Furthermore, analysis of production deployments reveals that teams implementing serverless microservices achieve more frequent deployments with fewer rollbacks compared to traditional microservice implementations [6].

Event-driven architectures (EDA) and reactive programming paradigms represent natural complements to serverless computing models, with most production serverless implementations incorporating event-driven patterns [5]. These architectures leverage serverless functions as event consumers, processing events generated by diverse sources, including databases, message queues, IoT devices, and user interactions. Performance analysis demonstrates that serverless EDA implementations

achieve lower coupling scores compared to requestresponse architectures, enabling superior system resilience and maintainability [6]. Message-based choreography patterns predominate in serverless implementations, with organizations reporting reductions in orchestration complexity decreased central coordination components compared to traditional service orchestration approaches [5]. Reactive programming paradigms further enhance these architectures by providing declarative composition of asynchronous and eventbased systems. Assessment of enterprise applications reveals that reactive serverless implementations achieve higher throughput under variable load conditions and lower latency variability compared to imperative approaches, with particularly pronounced benefits during traffic spikes [6].

Data processing pipelines and real-time analytics workflows represent compelling serverless use with many enterprises implementing serverless for at least one data processing function [5]. Event-triggered processing enables real-time data transformation with minimal infrastructure while consumption-based pricing complexity, aligns costs directly with processing volume. analysis of identical Comparative extracttransform-load (ETL) workloads demonstrates that serverless implementations achieve higher cost efficiency compared to traditional batch processing systems [6]. Organizations report reductions in data processing pipeline development time, with many achieving low processing latencies for events requiring fewer transformation steps [5]. Real-time analytics workflows particularly benefit from serverless architectures, with implementations achieving sub-second insights delivery compared to traditional approaches. Performance benchmarks that serverless stream indicate processing implementations handle higher throughput per compute dollar than persistent cluster deployments for workloads with intermittent or unpredictable volume [6]. Notably, organizations report successful implementation of complex analytical functions, including time-series analysis, anomaly detection. and predictive modeling serverless architectures, achieving lower total cost of ownership compared to dedicated analytics infrastructure [5].

State management presents distinctive challenges in inherently stateless serverless environments, necessitating specialized strategies for persistence and coordination. Research examining production serverless applications reveals that most employ external persistence services, with many utilizing NoSQL databases, object storage, and specialized state management services [6]. Performance

analysis demonstrates that optimized external state access patterns reduce function execution duration compared to naive implementations, with particular benefits derived from connection pooling, data locality, and asynchronous I/O [5]. Distributed strategies significantly caching performance, with high-throughput serverless applications implementing multi-level caching that reduces database interactions [6]. For workflow orchestration requiring state coordination across multiple functions, organizations report lower implementation complexity using specialized serverless workflow services compared to custom coordination mechanisms. Importantly, research examining production incidents reveals that a significant portion of serverless application failures stem from state management issues, with race conditions, inconsistent caching, and transactional boundary violations representing the most common failure modes [5]. Organizations implementing comprehensive state management strategies with clearly defined consistency models report fewer production incidents and faster mean time to resolution (MTTR) for state-related failures [6].

4. Challenges and Limitations

Cold start latency represents one of the most significant challenges in serverless computing, unpredictable performance introducing characteristics that can undermine application Comprehensive benchmarking responsiveness. across major serverless platforms reveals varying cold start latencies, with median values in the hundreds of milliseconds across function invocations [7]. These latencies stem from multiple sequential operations: container instantiation, runtime initialization, function code loading, and dependency resolution. Language selection significantly impacts these metrics, with compiled languages demonstrating lower cold start latencies compared to interpreted languages, while functions with larger dependency footprints experience longer initialization times compared to functions with minimal dependencies [8]. The implications of cold start latency extend beyond theoretical concerns, with user experience research indicating that users abandon web applications experiencing longer response times, and organizations reporting SLA violations directly attributable to cold start incidents [7]. Various mitigation techniques demonstrate varied effectiveness: pre-warming strategies reduce cold start frequency but introduce additional costs; dependency optimization reduces cold start duration for various runtimes; memory allocation increases reduce initialization time but increase per-invocation costs; and specialized

provisioned concurrency options eliminate cold starts for most requests but introduce base costs [8]. Observability, debugging, and monitoring present compound challenges in serverless architectures due to their distributed, ephemeral execution model. Analysis of production incidents reveals that debugging complexity increases in serverless applications compared to monolithic equivalents, with longer mean time to resolution (MTTR) [7]. This complexity stems from limited execution context, ephemeral runtime environments, and distributed trace fragmentation. Survey data from organizations indicates that many report significant gaps in their observability tooling following serverless adoption, with particular deficiencies in cross-function tracing, performance profiling, and end-to-end request visualization [8]. Traditional debugging approaches prove inadequate, with development teams reporting that local debugging environments fail to accurately reproduce production behavior for serverless functions. Organizations implementing comprehensive observability solutions specifically designed for serverless architectures report reductions in MTTR and decreases in production incidents, though these solutions increase monitoring costs and introduce runtime overhead depending on instrumentation depth [7]. Correlating events across distributed serverless components remains particularly challenging, with organizations reporting that reconstructing transaction flows requires manual intervention for complex operations spanning multiple distinct functions [8].

Vendor lock-in considerations represent significant strategic concerns in serverless adoption, with quantitative risk analysis indicating that migration costs from one serverless platform to another represent a substantial percentage of initial development costs [7]. This lock-in stems from deep integration with provider-specific services, with the average production serverless application utilizing multiple distinct managed services beyond core function execution. Survey data indicates that many organizations express concern regarding lock-in. though fewer implement serverless concrete portability strategies [8]. Comparative serverless offerings analysis of discrepancies in feature sets, with only a portion of advanced features being consistently available across major providers. Performance characteristics also vary substantially, with identical functions demonstrating execution time variations across platforms and cost differences for equivalent workloads [7]. Organizations pursuing portability implement various strategies with differing success rates: abstraction layers reduce migration effort but introduce performance overhead and increase development complexity; multi-cloud deployments improve resilience but increase operational costs; and standardized deployment frameworks reduce configuration drift but constrain utilization of platform-specific optimizations. Notably, organizations implementing the Serverless Framework report reductions in platform migration efforts compared to native tooling approaches, though this abstraction constrains access to advanced platform features [8].

Performance boundaries and execution constraints impose significant limitations on serverless applicability for certain workloads. Empirical analysis across function types reveals serverless platforms impose explicit including maximum constraints, execution duration, deployment package size, memory allocation, concurrent execution limits, temporary storage capacity [8]. These constraints render serverless architectures unsuitable for certain existing application workloads, including longrunning processes, memory-intensive computations, and storage-intensive operations. Performance indicates that serverless functions experience CPU throttling at a higher rate than equivalent virtual machine deployments, with CPU allocation closely correlating with memory configuration [7]. Network performance introduces additional limitations, with functions experiencing higher network latency to external services compared to dedicated compute resources, and bandwidth constraints reducing data transfer rates for larger operations. **Ephemeral** execution environments prohibit state persistence, with functions losing local state within minutes of inactivity [8]. Cold start penalties create particular challenges for latency-sensitive applications, with performance modeling indicating that applications requiring low P95 latencies experience SLA violations higher rates in serverless implementations compared to persistent compute deployments. Organizations implementing serverless architectures report successful migration for web application backends, data transformation pipelines, and event-handling systems, but lower success rates for computation-intensive workloads, stream processing applications with strict ordering requirements, and applications with strict real-time guarantees [7].

5. Current Landscape and Future Directions

Comparative analysis of major cloud provider offerings reveals substantial diversity in serverless implementations, with differentiated capabilities, performance characteristics, and pricing models. Quantitative benchmarking across function

deployments demonstrates that AWS Lambda commands the largest market share, followed by Azure Functions, Google Cloud Functions, and IBM Cloud Functions [9]. Performance analysis indicates variation in execution efficiency, with AWS Lambda demonstrating lower average execution times compared to Google Cloud Functions for identical workloads, while Azure Functions exhibits lower cold start latencies but higher compute costs per million executions [10]. Feature comparison across distinct serverless capabilities reveals that AWS leads in service breadth with high feature implementation, followed by Azure, Google, and IBM [9]. Pricing structures exhibit material differences, with computation charges and invocation fees varying across providers. Memory allocation granularity varies from smaller increments (AWS) to larger increments (Google), with direct cost implications for optimization. Maximum execution durations and concurrency limits also vary across providers [10]. Integration capabilities represent a key differentiator, with AWS offering native connections to numerous distinct services, followed by Azure, Google, and IBM. Organizations implementing multi-cloud serverless strategies report higher operational complexity but improved resilience compared to single-provider approaches [9].Industry adoption patterns demonstrate accelerating serverless implementation across diverse sectors, with market analysis indicating strong growth between 2018 and 2023 [9]. Sectorspecific adoption rates show considerable variation across technology, financial services, retail, healthcare, manufacturing, and public sector organizations. Organization size correlates with patterns, with larger adoption enterprises demonstrating higher adoption compared to smaller organizations. Use case maturity analysis across production implementations reveals that specific application categories have achieved substantial production validation: API backends, processing workflows, scheduled automation, web application hosting, IoT backends, and real-time analytics [10]. Conversely, use cases demonstrating maturity include high-performance limited computing, stateful workflows, and mission-critical with strict reliability requirements. systems Implementation success metrics vary by use case, with organizations reporting cost reductions for batch processing workloads. development acceleration for API implementations, scalability improvements for variable-demand applications. Notably, many organizations report unsuccessful serverless implementations for at least one attempted use case, with primary failure factors including performance limitations, complexity

management, and integration challenges [9].Research frontiers in serverless computing span multiple dimensions, with institutional and corporate research initiatives increasing significantly in recent years [10]. Performance optimization represents a primary research focus, with peer-reviewed publications addressing cold start mitigation, resource efficiency, execution isolation, and state management. Innovative approaches demonstrating particular promise include specialized container snapshots reducing initialization time, language-specific optimizations decreasing runtime overhead, and predictive scaling algorithms improving resource utilization while maintaining equivalent performance [9]. Security research has produced publications addressing serverless-specific concerns, with emphasis on multi-tenant isolation, fine-grained permission models, secure function composition, and supply chain vulnerabilities. Novel security techniques include side-channel attack mitigation, automated least-privilege policy generation, and formal verification methods identifying potential vulnerabilities [10]. Interoperability research encompasses publications focused on crossplatform abstraction, standardized deployment models, and function portability. Significant advancements include platform-agnostic development frameworks reducing implementation differences, unified monitoring approaches capturing relevant telemetry across heterogeneous environments, and automated migration tooling decreasing transition effort compared to manual reimplementation [9].Convergence with edge computing and artificial intelligence technologies represents perhaps the most transformative frontier in serverless evolution. Edge-serverless integration research has produced publications demonstrating latency reductions for geo-distributed applications through function deployment at network edge locations [10]. Implementation benchmarks indicate that edge-serverless architectures achieve lower P95 latency for location-sensitive workloads compared to centralized cloud deployment, while reducing bandwidth consumption through local data processing. Challenges in this integration include limited compute capacity, connectivity constraints, and security complexities [9]. Artificial intelligence convergence manifests in bidirectional integration: serverless platforms as AI delivery mechanisms and AI techniques enhancing serverless operations. For delivery, serverless implementations ΑI demonstrate cost reduction for inference workloads with variable demand compared to dedicated infrastructure. while enabling faster model deployment cycles [10]. Research indicates that many machine learning inference workloads exhibit request patterns well-suited to serverless scaling characteristics. Conversely, AI enhancement of serverless operations demonstrates compelling benefits: predictive scaling algorithms reduce resource provisioning errors, intelligent function placement improves execution efficiency, automated code optimization enhances performance, and anomaly detection identifies potential failures earlier than threshold-based approaches [9]. Industry analysts project that by 2025, most organizations implementing serverless will incorporate edge deployment capabilities, while many will leverage AI-enhanced operational frameworks, representing the convergence of these transformative technologies [10].

Benefits of Serverless Computing



Figure 1: Benefits of Serverless Computing [3, 4]

Table 1: Serverless computing adoption spectrum from simple to complex [5, 6]

| Architectural Pattern | Key Benefits | Organizational Outcomes |
|---------------------------|----------------------------------|---|
| Fine-grained Microservice | Superior isolation with reduced | Reduced time for individual service |
| Decomposition | cascading failures | updates; faster achievement of |
| | | continuous deployment capabilities |
| Domain-driven Design | Improved team autonomy; reduced | Better alignment with organizational |
| with Bounded Contexts | cross-team dependencies | structure; clearer separation of concerns |
| Event-driven Architecture | Lower coupling scores; superior | Reduced orchestration complexity; |
| (EDA) | system resilience | decreased central coordination |
| | | components |
| Reactive Programming | Higher throughput under variable | Particularly pronounced benefits during |
| Paradigms | load; lower latency variability | traffic spikes; more predictable |
| | | performance |
| Specialized State | Reduced function execution | Fewer production incidents; faster mean |
| Management | duration; enhanced performance | time to resolution for state-related |
| | through multi-level caching | failures |

Serverless limitations range from minor to major impact.



Figure 2: Serverless limitations range from minor to major impact [7, 8]

Serverless provider feature breadth, from basic to comprehensive.



Figure 3: Serverless provider feature breadth, from basic to comprehensive [9, 10] 7678

4. Conclusions

The serverless computing paradigm fundamentally reshaped cloud architecture, offering unprecedented levels of abstraction, scalability, and cost efficiency while introducing new challenges and constraints. As evidenced throughout this examination, serverless adoption continues to accelerate across diverse industry sectors, with particular maturity in API backends, processing, and event-driven applications, though certain use cases remain poorly suited to serverless constraints. The competitive landscape among cloud providers has driven rapid feature evolution, though significant implementation differences persist, complicating portability efforts. Research frontiers in performance optimization, security enhancements, and interoperability show promising advances in addressing current limitations, particularly regarding cold start mitigation, multitenant isolation, and cross-platform standardization. Perhaps most significantly, the convergence of serverless with edge computing enables dramatic improvements for geo-distributed latency applications, while bidirectional integration with artificial intelligence technologies enhances both deployment efficiency and operational intelligence. As these technologies continue to mature and converge, serverless computing stands poised to become the dominant model for cloud application fundamentally changing development, organizations conceptualize, build, and operate cloud-native applications while demanding new architectural approaches, operational practices, and development methodologies to fully realize its transformative potential.

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