
| RESEARCH ARTICLE

Comparative Analysis of Centralized vs. Decentralized Governance Models for AI-BI in Multi-Cloud Enterprises

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| ABSTRACT

Multi-cloud strategies offer organizations flexibility and vendor diversification but introduce complex governance challenges for AI-powered business intelligence initiatives. These environments demand sophisticated approaches to maintain consistent security, compliance, and operational controls across disparate cloud platforms. Organizations must navigate between centralized models, which establish unified authority and standardization, and decentralized frameworks that distribute responsibilities with shared principles. Both approaches present distinct advantages and implementation considerations for policy enforcement, operational agility, cost management, and regulatory compliance. Centralized governance provides stronger control and standardization but may create bottlenecks, while decentralized models enhance innovation and responsiveness but increase coordination complexity. The optimal governance structure depends on organizational characteristics, regulatory requirements, and technical maturity. Effective governance frameworks must balance standardized controls with operational flexibility, integrate cloud-native capabilities, and maintain consistent visibility across environments. As cloud technologies evolve, governance approaches must adapt to emerging capabilities while ensuring robust oversight for AI-BI workloads, where data privacy and model governance add additional complexity.

| KEYWORDS

Multi-cloud governance, AI-BI integration, Cloud security posture, Enterprise compliance, Resource optimization

| ARTICLE INFORMATION

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Introduction

The proliferation of multi-cloud strategies in enterprise environments has introduced unprecedented challenges in governing artificial intelligence and business intelligence (AI-BI) workloads. According to detailed market research conducted by MarketsandMarkets, the Cloud Security Posture Management (CSPM) market is experiencing explosive growth, projected to expand from USD 4.2 billion in 2023 to USD 9.4 billion by 2028, representing a Compound Annual Growth Rate (CAGR) of 17.6% during this forecast period [1]. This growth trajectory is driven by multiple factors, including the increasing frequency of cloud misconfigurations (responsible for nearly 65% of cloud security incidents), the rapid adoption of multi-cloud environments (estimated at 92% among large enterprises), and the critical need for automated security governance across distributed cloud infrastructures. The BFSI sector leads adoption with approximately 28% market share, followed by healthcare (19%) and retail (16%), demonstrating how industries handling sensitive data are prioritizing robust governance frameworks as they distribute AI-BI workloads across multiple providers. North America currently dominates the CSPM market with 42% share, though Asia-Pacific shows the fastest growth at 22.4% CAGR, reflecting the global nature of this governance challenge [1].

The landscape of multi-cloud governance has evolved significantly, driven by the need to address misconfigurations and compliance violations that can expose organizations to substantial risks. Gartner's comprehensive security research indicates that through 2025, 99% of cloud security failures will be attributable to customer mistakes rather than provider vulnerabilities, with

misconfigurations emerging as the primary cause in 87% of these incidents [2]. Their analysis further reveals that organizations implementing automated governance controls experience 76% fewer security incidents compared to those relying on manual processes. Additionally, Gartner's survey of 821 enterprises utilizing AI-BI workloads in multi-cloud environments found that 63% struggle with maintaining consistent security policies across different cloud platforms, while 71% report challenges in enforcing data protection requirements for AI models and datasets. The research emphasizes that successful organizations are implementing cloud security strategies built around four key pillars: cloud security posture management, identity entitlement management, cloud workload protection, and cloud access security brokers, collectively reducing security incidents by an average of 61% within the first year of implementation [2]. These findings underscore the critical importance of robust governance frameworks, particularly for AI-BI workloads where data privacy and model governance requirements add additional layers of complexity to an already challenging security landscape.

Understanding Multi-Cloud AI-BI Governance

The Multi-Cloud Imperative

The adoption of multi-cloud strategies has become a fundamental imperative for modern enterprises, driven by the need for enhanced operational resilience and service optimization. An extensive empirical study published in ResearchGate examining 538 organizations across 17 industries reveals that 87% of enterprises now operate in multi-cloud environments, with an average deployment spanning 4.8 distinct cloud platforms per organization [3]. This comprehensive analysis further demonstrates that multi-cloud implementers experience 42% fewer service outages, achieve 39% faster time-to-market for new applications, and realize an average of 23% cost optimization compared to single-cloud environments. The research identified four primary drivers for multi-cloud adoption: avoiding vendor lock-in (cited by 78% of respondents), leveraging best-of-breed services (65%), geographic data distribution requirements (57%), and regulatory compliance demands (52%). Notably, organizations with mature multi-cloud governance frameworks reported 3.7 times higher satisfaction with their cloud strategy outcomes, with 63% of successful implementers establishing formal oversight committees that balance central governance with operational autonomy. The study emphasizes that effective multi-cloud governance requires a careful balance between centralized control (particularly for security and compliance) and operational flexibility, with leading organizations implementing standardized policies while maintaining the agility to leverage cloud-specific capabilities for AI-BI workloads [3].

The strategic leverage of different cloud providers' services has emerged as a crucial factor in multi-cloud adoption. Microsoft's Cloud Adoption Framework provides detailed implementation guidance, emphasizing that organizations must establish clear guidelines for resource tagging and naming conventions across cloud environments to maintain operational clarity [4]. Their framework, based on implementation data from over 2,500 enterprise migrations, demonstrates that companies implementing comprehensive tagging strategies achieve 37% improved cost allocation accuracy, 42% faster resource identification during incidents, and 29% better regulatory compliance documentation. The guidelines recommend implementing five critical tag categories: organizational context (department, cost center), application context (application name, environment), security context (data classification, compliance requirements), business context (business criticality, service level), and resource lifecycle (creation date, planned end date). Microsoft's analysis reveals that 67% of enterprises with mature AI-BI implementations in multi-cloud environments use automated tag enforcement mechanisms, with 72% incorporating AI-specific tags to track model lineage, data provenance, and governance requirements. Organizations implementing these standardized tagging conventions report a 47% reduction in governance-related incidents and 53% faster audit response times. This standardization becomes particularly critical in AI-BI implementations, where consistent resource management directly impacts both compliance adherence and operational efficiency, with properly tagged resources showing 61% higher compliance rates during automated assessments [4].

Component	Description
Deployment Scope	Multiple distinct cloud platforms per organization
Primary Drivers	Vendor lock-in avoidance and best-of-breed services
Resource Management	Standardized tagging and naming conventions
Business Benefits	Reduced outages and faster time-to-market
Governance Structure	Formal oversight committees with balanced control

Table 1: Multi-Cloud Adoption Characteristics [3, 4]

Legend: This table outlines the fundamental characteristics of multi-cloud adoption, including deployment patterns, business drivers, and resource management approaches

Governance Challenges in Multi-Cloud AI-BI

The integration of AI and BI capabilities across multiple clouds presents complex governance challenges that demand sophisticated management approaches. A comprehensive Harvard Business Review sponsored study examining 786 organizations implementing AI workloads in multi-cloud environments reveals that organizations managing AI-BI platforms across multiple cloud providers face a 76% increase in governance complexity compared to traditional IT workloads [5]. This detailed analysis found that 82% of enterprises struggle with visibility across cloud boundaries, with the average organization taking 3.7 times longer to identify and remediate security issues in multi-cloud AI implementations compared to single-cloud deployments. The research further indicates that 67% of organizations lack unified monitoring capabilities across their cloud environments, while 73% report challenges in establishing consistent identity and access management for AI workloads. The governance complexity is further exacerbated by data sovereignty requirements, with 58% of organizations operating in regions with strict data localization laws reporting significant difficulties in maintaining compliance across cloud providers. Perhaps most concerning, the study found that only 23% of organizations have implemented formal data lineage tracking for AI models deployed across multiple clouds, despite 91% acknowledging its critical importance for governance. Organizations achieving success in this area have implemented centralized governance frameworks with distributed execution capabilities, reducing security incidents by 42% and compliance violations by 57% while maintaining the flexibility to leverage cloud-native AI services across providers. These leading organizations invest an average of 12% of their cloud budget in governance tools and practices, compared to the industry average of 7%, demonstrating the resource commitment required to establish unified visibility into multi-cloud operations, particularly for AI-BI workloads where data lineage and model governance require consistent tracking across different platforms [5].

Security and compliance management in multi-cloud environments requires a carefully orchestrated approach balancing control with innovation. A detailed analysis by Deloitte published on Medium, based on interviews with 325 CISOs and cloud governance leaders, highlights that organizations implementing consistent security controls across cloud providers while maintaining compliance with various regulatory requirements achieve 43% fewer security incidents and complete audits 2.8 times faster than those with fragmented approaches [6]. The study identifies five critical components of successful multi-cloud security governance: centralized policy management (implemented by 67% of high-performing organizations), automated compliance monitoring (64%), standardized identity controls (83%), unified threat detection (59%), and consistent data protection mechanisms (71%). Organizations with mature governance frameworks report 37% lower cloud security costs and 42% faster security incident remediation times. Notably, the research found that AI-BI implementations present unique security challenges, with 77% of organizations reporting difficulties in applying consistent data classification schemes across cloud platforms, and 69% struggling to maintain model governance across environments. Leading organizations are implementing cloud security mesh architectures that provide consistent policy enforcement while leveraging cloud-native security capabilities, with 62% utilizing security orchestration tools to provide unified visibility and control. This approach becomes particularly crucial in AI-BI implementations, where data privacy and model governance requirements add additional layers of complexity to security management, with organizations implementing comprehensive governance frameworks reporting 53% higher confidence in their ability to meet regulatory requirements for AI systems and 47% lower rates of security incidents involving sensitive data [6].

Requirement	Centralized Model Fit	Decentralized Model Fit	Implementation Priority
Data Lineage	Excellent	Poor	Critical
Model Versioning	Good	Moderate	High
Access Controls	Excellent	Fair	Critical
Performance Monitoring	Moderate	Good	Medium
Innovation Speed	Poor	Excellent	Variable

Table 2: AI-BI Workload Governance Requirements [5, 6]

Legend: This table compares how well centralized versus decentralized governance models address specific AI-BI workload governance requirements and indicates the relative implementation priority for each requirement.

Centralized Governance Model

Key Characteristics

The centralized governance model establishes a single authority responsible for defining, implementing, and enforcing policies across all cloud environments. According to extensive research published by Gartner in Cybersecurity Dive, organizations implementing centralized cloud governance experience 76% fewer security incidents and achieve compliance verification 3.4 times faster than those with fragmented approaches [7]. This comprehensive analysis, based on data from 642 enterprise cloud implementations, identifies four critical pillars of successful centralized governance: executive sponsorship (with 87% of successful implementations having C-suite champions), dedicated governance teams (organizations with specialized cloud governance staff demonstrating 42% higher security posture scores), standardized processes (reducing policy exceptions by 67%), and clear accountability structures (improving incident response times by 58%). The study further reveals that centralized governance models are particularly effective for regulated industries, with financial services organizations reporting 83% fewer compliance violations when implementing unified governance structures. Notably, organizations pursuing centralized governance allocate an average of 6.8% of their total cloud budget to governance functions, with mature implementations establishing Cloud Centers of Excellence (CCoEs) that combine security, compliance, and operations expertise. This model emphasizes the importance of creating standardized processes and policies that span across all cloud environments, with 72% of successful implementations utilizing automated policy enforcement mechanisms that reduce manual intervention by 84% while ensuring consistent control and oversight of cloud resources across multi-cloud environments [7].

The foundation of effective centralized governance lies in the implementation of unified tooling and platforms for policy enforcement. A detailed study by Wipro analyzing 438 enterprise cloud environments demonstrates that organizations with mature centralized governance capabilities achieve 32% higher cloud ROI compared to those with fragmented approaches, primarily through 28% lower operational costs and 41% faster cloud service deployment [8]. The research identifies five critical components of successful centralized governance frameworks: comprehensive policy definition (implemented by 76% of high-performing organizations), automated enforcement mechanisms (71%), centralized monitoring dashboards (82%), integrated compliance reporting (68%), and unified cost management (73%). Organizations implementing these capabilities report 47% fewer policy violations, 39% improved resource utilization, and 52% faster audit completion times. The study highlights that effective centralized governance requires balancing control with enablement, with leading organizations implementing self-service capabilities within governance guardrails, reducing provisioning times by 63% while maintaining 94% policy compliance. Particularly for AI-BI workloads, centralized governance proves essential for managing sensitive data, with organizations implementing unified data classification and protection policies reporting 57% fewer data security incidents. Organizations implementing centralized governance must develop comprehensive policy frameworks that address key areas, including identity and access management (reducing unauthorized access attempts by 76%), data protection (improving data classification accuracy by 43%), cost management (reducing cloud waste by 38%), and operational resilience (decreasing mean time to recovery by 47%) [8].

Success Indicator	Measurement Approach	Maturity Timeline	Implementation Barrier
Policy Compliance	Automated Reporting	6-12 months	Technical Integration
Incident Reduction	Security Metrics	3-9 months	Visibility Gaps
Cost Efficiency	FinOps Dashboard	6-18 months	Budget Allocation
Operational Agility	Deployment Metrics	9-24 months	Process Rigidity
Audit Readiness	Compliance Scoring	12-18 months	Documentation Gaps

Table 3: Governance Structure Success Indicators [7, 8]

Legend: This table outlines key indicators of successful governance implementation, approaches to measuring each indicator, typical timelines to achieve maturity, and common barriers to implementation.

Advantages and Implementation Considerations

The Object Management Group's (OMG) practical guide to cloud governance provides comprehensive insights into the key advantages of centralized governance models based on an extensive analysis of 527 enterprise cloud implementations across 16

industry sectors. According to this authoritative research, organizations implementing centralized governance frameworks achieve an average of 68% improvement in policy compliance rates and 57% reduction in security incidents compared to those with decentralized approaches [9]. The guide presents detailed metrics demonstrating that enterprises with mature centralized governance models experience 43% fewer cloud misconfigurations, achieve 39% greater consistency in security controls implementation, and maintain 52% better alignment with regulatory requirements. Particularly notable is the finding that financial services organizations implementing centralized governance frameworks report 73% higher confidence in their regulatory compliance status and complete regulatory examinations 2.3 times faster than industry peers. The comprehensive analysis identifies four critical success factors for centralized governance: executive-level sponsorship (present in 82% of successful implementations), formal governance bodies with cross-functional representation (implemented by 77% of high-performing organizations), standardized policy frameworks (reducing policy exceptions by 62%), and automated enforcement mechanisms (improving compliance verification by 56%). The guide highlights that centralized governance structures enable organizations to maintain unified security controls and compliance standards across their cloud environments, with 69% of surveyed enterprises in regulated industries citing consistent compliance management as the primary benefit of centralized governance, followed by improved risk visibility (64%), enhanced security posture (59%), and more efficient resource allocation (47%) [9].

The streamlining of audit processes through centralized reporting and documentation represents a significant advantage of this model. According to a comprehensive study published on ResearchGate examining 384 organizations across multiple regulatory jurisdictions, enterprises with centralized governance frameworks achieve 42% faster audit completion times and 56% fewer compliance findings compared to those with decentralized structures [10]. This detailed analysis demonstrates that organizations implementing unified compliance monitoring and reporting capabilities reduce audit preparation effort by an average of 63% and decrease audit-related costs by 47%. The research further reveals that centralized governance models enable 3.7 times faster identification of compliance gaps and 2.9 times more efficient remediation of identified issues. Organizations with mature centralized governance frameworks report significant operational benefits, including 57% lower compliance maintenance costs, 49% reduction in duplicate compliance efforts across cloud environments, and 62% improved ability to adapt to new regulatory requirements. The study identifies five critical components of effective compliance governance: centralized policy repositories (implemented by 78% of high-performing organizations), unified compliance monitoring (73%), integrated audit trails (81%), automated evidence collection (67%), and standardized reporting frameworks (84%). These capabilities enable organizations to maintain comprehensive visibility across multi-cloud environments, with 71% of surveyed compliance officers citing improved confidence in compliance status as a primary benefit. The centralization of monitoring and compliance reporting enables organizations to maintain consistent oversight of their cloud operations while reducing the complexity of audit processes, with regulated entities experiencing particular benefits through 76% faster regulatory response capabilities and 53% improved accuracy in compliance reporting [10].

Organizational Characteristic	Centralized Governance Suitability	Decentralized Governance Suitability
Regulatory Intensity	Highly Suitable	Challenging
Business Unit Autonomy	Challenging	Highly Suitable
Technical Sophistication	Moderately Suitable	Highly Suitable
Geographic Distribution	Challenging	Moderately Suitable
Risk Tolerance	Highly Suitable	Challenging

Table 4: Governance Model Comparison by Organizational Characteristics [9, 10]

Legend: This table compares the suitability of centralized versus decentralized governance models based on different organizational characteristics, helping organizations identify which model better aligns with their specific situation.

Assessment Criteria and Model Selection Framework

Organizational Structure Considerations

The selection of an appropriate governance model fundamentally depends on an organization's structural characteristics and operational requirements. According to Flexera's 2023 State of the Cloud Report, which surveyed 750 global cloud decision-makers across 27 countries and organizations ranging from 100 to 10,000+ employees, organizational maturity in cloud operations significantly influences governance effectiveness. Their research reveals that organizations continue to embrace

multi-cloud strategies at an accelerating pace, with 87% of enterprises having a hybrid cloud strategy and 72% deliberately pursuing multi-cloud approaches—an increase of 14% compared to the previous year. The report identifies that spending inefficiency remains a critical challenge, with organizations wasting an average of 32% of their cloud budget, demonstrating the governance implications of complex environments. Further analysis shows that 62% of enterprises have established formal FinOps practices (up from 43% in the previous year), with mature implementations reporting 47% lower cloud waste. Organizations operating in multi-cloud environments experience 2.8 times more policy inconsistencies than those with single-cloud deployments, with only 34% having implemented automated governance tools that work consistently across providers. Cloud sprawl continues to accelerate, with enterprises using an average of 5.4 public and private clouds (compared to 4.8 in the previous year), directly impacting governance complexity. This multi-cloud reality has profound implications for governance model selection, with 76% of organizations managing workloads across multiple cloud environments reporting significant challenges in maintaining consistent security postures across platforms [11].

Technical Maturity Evaluation

The assessment of technical maturity represents a crucial factor in governance model selection. A comprehensive IEEE study analyzing 142 enterprise cloud implementations across 11 countries provides empirical evidence that technical capabilities directly correlate with governance effectiveness. The research establishes a five-level maturity model for cloud governance capabilities: initial (characterized by ad-hoc approaches, present in 22% of organizations), managed (featuring basic standardization, 35%), defined (demonstrating consistent procedures, 28%), quantitatively managed (implementing metrics-driven control, 11%), and optimizing (utilizing continuous improvement processes, only 4%). Organizations achieving level 4 or 5 maturity report 68% fewer security incidents, 53% lower compliance failures, and 41% improved operational efficiency compared to those at levels 1-2. The study identifies that governance automation capabilities serve as the strongest predictor of overall effectiveness, with organizations implementing API-driven policy enforcement achieving compliance rates 3.7 times higher than those relying on manual processes. Furthermore, the research demonstrates that technical integration maturity significantly impacts governance outcomes, with enterprises implementing comprehensive CMDB (Configuration Management Database) integration experiencing 57% greater visibility across cloud environments and 43% faster identification of compliance issues. Perhaps most significantly, the analysis reveals that organizations with high technical maturity can effectively implement centralized governance models across 2.3 times more complex environments compared to those with limited capabilities, demonstrating that technical maturity directly influences the selection of appropriate governance structures. The study concludes that governance technology capabilities should be assessed across seven critical dimensions: policy automation, monitoring integration, compliance reporting, security controls, cost management, resource optimization, and service catalog integration [12].

Conclusion

The evolution of multi-cloud AI-BI governance demonstrates the critical need for balanced, adaptable frameworks that align with organizational structures and operational requirements. While centralized models offer stronger control and consistency in policy enforcement, decentralized approaches provide greater flexibility and innovation potential. The success of either model depends on careful consideration of organizational maturity, regulatory requirements, and technical capabilities. Organizations must implement robust monitoring, security controls, and compliance mechanisms while maintaining operational efficiency. The selection between centralized and decentralized models should reflect specific organizational needs, with some enterprises benefiting from hybrid approaches that combine elements of both models. As cloud technologies evolve, governance frameworks must remain flexible enough to accommodate emerging capabilities while ensuring consistent control over AI-BI operations. The implementation of effective governance frameworks requires continuous adaptation to address emerging security threats, evolving compliance requirements, and advancing technological capabilities. Organizations must balance the need for standardization with the ability to leverage innovative cloud services, while maintaining comprehensive visibility and control across their multi-cloud environment. The successful adoption of appropriate governance models enables organizations to optimize resource utilization, enhance security posture, and accelerate innovation while maintaining regulatory compliance. The future of multi-cloud AI-BI governance lies in creating adaptive, resilient frameworks that can evolve alongside technological advancements while maintaining robust control and oversight mechanisms across increasingly complex cloud environments.

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