

# The Future of Compliance-as-a-Service (CaaS) in Cloud Security

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## Abstract

The concept of cloud computing has transformed the current operations of enterprises, which pose new difficulties in maintaining regulatory compliance in dynamic and volatile environments. These strategies combine to give rise to Compliance-as-a-Service (CaaS), which would convert the traditional point-in-time assessment models to continuous and automated compliance systems. The article discusses the current trajectory of CaaS in cloud security systems in terms of its technical underpinnings and the aspects to take into account during implementation. The move towards compliance-as-code practices, AI-based controls, and standardized control models allows organizations to integrate compliance into development lifecycle processes and ensure visibility into complex architectures in real-time. Although certain issues like trust, may affect the implementation of CaaS, data privacy issues, and integration issues, CaaS is bound to change compliance beyond a reactive liability to a strategic enabler of secure cloud innovation that will make organizations unafraid of adopting cloud technologies without losing their regulatory orientation in the growing, complex environment.

**Keywords:** Cloud Compliance Automation, Continuous Monitoring, Compliance-As-Code, Regulatory Technology, Multi-Cloud Governance

## I. Introduction

Cloud computing has completely changed modern enterprises, and it forms the backbone of digital transformation efforts in various industries. As more organizations base their operations on distributed cloud environments, they have the difficulty of ensuring compliance across various providers, service models, and dynamic architectures. The impermanence of cloud resources, in which a virtual machine, a container, or a serverless function can only last a few minutes, makes compliance a landscape that the traditional one cannot effectively respond to [1].

An ideal solution to such challenges has been Compliance-as-a-Service (CaaS)- a managed and cloud-native model that incorporates ongoing monitoring, automated control validation, and expertise specialization to ensure regulatory compliance. In contrast to conventional approaches, CaaS integrates security and compliance needs into cloud operation processes to empower organizations to retain visibility in volatile environments in which manual management would be unfeasible. This integration is the consequence of increasing awareness of the need to move compliance beyond periodic testing to continuous assurance [1].

The conventional compliance paradigm is extremely constrained in cloud ecosystems. The traditional method, which is based on yearly audits, paper-based collection of evidence, and the United States of America-like documentation, is fundamentally incompatible with the dynamism of the cloud infrastructure. It is with point-in-time assessment being rapidly outdated as the configuration is changed programmatically and the resources are automatically scaled, exposing the risk between formal reviews. This disjoining exposes organizations to configuration drift and security vulnerabilities and pulls technical resources out of innovation and into compliance management [2].

CaaS is changing compliance into a responsive liability and an initiative towards safe cloud adoption. CaaS is an excellent alternative that enables organizations to trust cloud technologies and remain regulatory-compliant by automating evidence collection, continuously validating controls, and delivering real-time visibility. This proactive method helps a team to detect and correct compliance violations early in the development lifecycle, which will save a great deal of money and possibly penalties. The compliance requirements are also integrated into infrastructure-as-code pipelines and CI/CD pipelines, which also facilitate the transformation of devsecops practices, where security and compliance are shared concerns, no longer isolated functions [2].

This article discusses the history of CaaS in cloud security systems, its technological background, implementation aspects, and future. In compliance-as-code approaches, artificial intelligence and predictive monitoring applications, this analysis would offer technology leaders, security professionals, and compliance experts valuable lessons to reconsider the role of compliance in more complex cloud environments. The main sections that will transpire next are the primary

motivators of CaaS adoption, architecture, challenges of implementation, and the ways of exploring CaaS to both improve security posture and business agility.

## **II. The Evolution from Static to Continuous Compliance**

In the past, compliance management has been a resource-consuming process that was marked by manual procedures and intermittent spurts of activity. Regulatory compliance was treated as project work by organizations, with designated teams compiling documentation bundles, collecting evidence, and getting ready to undergo periodic audits. This legacy system was overly dependent on spreadsheets, manual screenshots, and lots of paperwork, which created productivity bottlenecks that are getting more problematic with the rapid uptake of cloud computing. With highly dynamic cloud environments, with shifting configurations and automatically scaled environments, even simple compliance artifacts became obsolete rapidly, introducing serious disjunctions between to-be-described controls and the reality on the ground [3].

The shift towards continuous monitoring as the replacement of point-in-time audits is a fundamental shift in the methodology of compliance. Instead of viewing compliance as an occasional phenomenon, progressive organizations currently establish technologies that relentlessly verify the efficacy of controls throughout cloud frameworks. This development offers real-time insights into compliance conditions, and automated systems constantly check that the settings, permissions, and security levels comply with regulations. Real-time monitoring enables security staff to detect control failures as soon as they happen, and those exposure periods between assessments are significantly lowered, and a more realistic manifestation of compliance posture is developed [4].

As a key facilitator of this ongoing method, compliance-as-code methodologies have arisen. Organizations share control validation requirements through the provisioning of infrastructure and application deployment by encoding them in machine-readable formats. This enables compliance checks to be automatically triggered in CI/CD pipelines and blocks the deployment of non-compliant resources, in addition to putting development teams on notice. The change is a combination of the convergence of DevOps and compliance cultures, and uses the advantages of automation, consistency, and version control to compliance procedures [3].

Audit preparation and demonstration of compliance have been transformed by the real-time capabilities of evidence collection. Advanced platforms can now communicate directly with cloud APIs, security tools, and monitoring solutions to automatically produce evidence of control effectiveness. These systems keep gathering configuration data, access logs, vulnerability findings, and any other telemetry that is necessary to confirm compliance requirements. The machine learning methods upscale this process by recognizing patterns, correlating events, and pointing out the possible control weaknesses prior to their eliciting violations. This automation is turning the audit experience into one that is not only disruptive and resource-intensive but also a validation of constantly-monitored controls [4].

<b>Key Aspect</b>	<b>Traditional Approach</b>	<b>Modern CaaS Approach</b>
Compliance Cycle	Periodic audits	Continuous monitoring
Evidence Collection	Manual, labor-intensive	Automated, real-time
Documentation	Static artifacts	Dynamic, continuous validation
Control Implementation	Manual configuration	Compliance-as-code
Audit Preparation	Project-based, disruptive	Always audit-ready
Standardization	Siloed approaches	Common taxonomies and frameworks

Table 1: The Evolution from Static to Continuous Compliance [3, 4]

The acknowledgment of continuous compliance as the new standard in the industry has triggered the development of joint efforts to develop standard approaches and technologies. These standards define shared taxonomies of controls, evidence types, and attestation mechanisms- building the basis of interoperable compliance ecosystems. These initiatives provide the ability to make the information flow between compliance tools, cloud environments, and audit processes seamless by establishing standard data models of control goals and evidence requirements. When these standards are well

developed, they will enhance the processes of compliance even more, as well as the consistency of assessment across the multi-cloud environments [3].

### III. Technological Enablers of Modern CaaS

The automation and orchestration technologies have essentially revolutionized the concept of compliance management in the sense that they have formalized processes that were hitherto manual. Recent Compliance-as-a-Service systems are based on advanced workflow engines that are used to organize the process of evidence gathering, validation, and reporting in complex cloud systems. These systems are integrated with cloud service provider APIs to constantly check configuration states, permissions, and security controls- confirming their compliance with compliance requirements automatically. The orchestration layer allows arranging the order or sequence of compliance activities, which starts with the initial scoping and includes evidence acquisition and concludes with the final reporting. These orchestration capabilities enable organizations to efficiently scale compliance operations across multiple cloud providers and thousands of discrete resources in parallel as regulatory requirements become more and more complex [5].

#### CaaS Reference Architecture

A comprehensive CaaS implementation requires a well-architected technical framework that integrates multiple specialized components. Figure 1 illustrates a reference architecture for enterprise-scale CaaS deployments that addresses the full compliance lifecycle from evidence collection to auditor interaction.

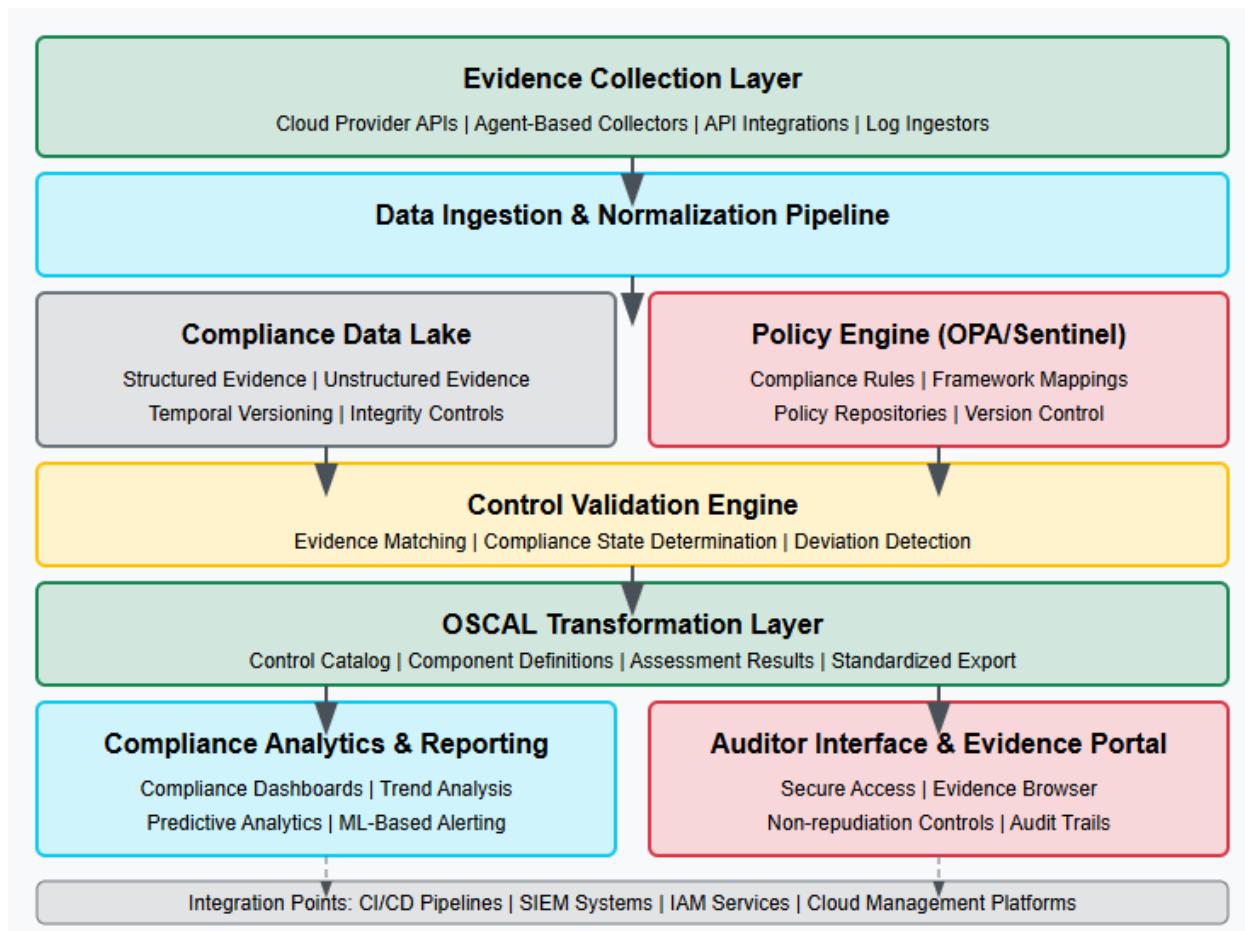


Fig 1: CaaS Reference Architecture Diagram

The architecture is designed around several key components:

1. **Evidence Collection Layer:** Distributed collectors gather compliance evidence through cloud provider APIs (AWS Config, Azure Policy, GCP Security Command Center), agent-based monitoring for on-premises systems, and log ingestion pipelines. This layer implements a provider-agnostic abstraction to normalize telemetry across heterogeneous environments.

2. **Policy Engine:** Leveraging Open Policy Agent (OPA) or HashiCorp Sentinel, this component maintains machine-readable compliance policies expressed in domain-specific languages. A sample OPA policy for validating encryption requirements might be structured as:

□ package compliance.encryption

```
import data.evidence
import data.controls
default compliant = false
# Control validation logic
compliant {
    input.storage_type == "s3"
    input.encryption_enabled == true
    input.encryption_type == "AES-256"
}
# Alternative compliance path
compliant {
    input.storage_type == "s3"
    input.encryption_enabled == true
    input.kms_key_id != ""
}
# Evidence association
violations[msg] {
    not compliant
    msg := sprintf("Resource %v fails encryption requirements", [input.resource_id])
}
```

□

3. **Compliance Data Lake:** A specialized data repository optimized for compliance evidence with temporal versioning, chain-of-custody validation, and cryptographic integrity controls. This component implements evidence tagging, classification, and retention policies to maintain audit readiness.

4. **OSCAL Export Layer:** Transforms internal compliance data into standardized OSCAL formats (JSON/XML) for interoperability. An example OSCAL component definition might include:

□ {

```
"component-definition": {
    "uuid": "8f0a0c17-8bd4-4a18-a2a0-fcbd44c04a76",
    "metadata": {
        "title": "Cloud Storage Encryption Component",
        "last-modified": "2025-03-15T12:00:00Z",
        "version": "1.0.0",
        "oscal-version": "1.0.0"
    }
}
```

```
},  
"components": [  
{  
  "uuid": "6f25a276-4apa-4e48-bfb4-067ab4079f56",  
  "type": "service",  
  "title": "Encrypted Storage Service",  
  "description": "Cloud storage with encryption at rest",  
  "control-implementations": [  
    {  
      "source": "https://csrc.nist.gov/Projects/risk-management-framework",  
      "implemented-requirements": [  
        {  
          "control-id": "sc-28",  
          "description": "Protection of Information at Rest"  
        }  
      ]  
    }  
  ]  
}  
]  
}  
}  
}
```

□

5. **Auditor Interface:** Provides secure, role-based access for external auditors to review compliance evidence, control effectiveness, and attestation artifacts. This interface implements non-repudiation controls and comprehensive audit logging.

### Performance Metrics and Operational Benchmarks

Modern CaaS implementations deliver measurable improvements across key performance indicators. Table 2 presents empirical benchmarks from enterprise CaaS deployments:

Metric	Traditional Approach	CaaS Implementation	Improvement
Audit preparation time	45-60 days	5-10 days	78-89% reduction
Mean Time to Detect (MTTD) compliance drift	7-30 days	15 minutes - 4 hours	98-99% reduction
False positive rates (tuned system)	15-25%	2-5%	67-87% reduction
Evidence freshness	Quarterly snapshots	Real-time to 6 hours	Near continuous

Control validation throughput	100-200 resources/day	10,000+ resources/hour	1,200-2,400% increase
Resource overhead	8-12 FTEs	1.5-3 FTEs + CaaS platform	63-88% reduction

Table 2: Presents empirical benchmarks from enterprise CaaS deployments [5, 6]

These metrics demonstrate the substantial operational efficiencies achieved through CaaS adoption. Particularly noteworthy is the dramatic reduction in Mean Time to Detect compliance drift, from weeks to minutes, enabling organizations to maintain continuous compliance rather than point-in-time certification states.

Machine learning and artificial intelligence have transformed various functions of compliance management. There are now algorithms in natural language processing that read the regulatory documents and contractual requirements and extract obligations automatically, and map these to technical controls. Machine learning models that are trained using past compliance data are able to discover patterns that can be used to forecast possible control failures and respond proactively. The anomaly detection systems continuously scan the cloud configurations, user actions, and system operations to detect non-compliance with compliance baselines, indicating problems to be reviewed or automatically remediated. Such AI functions are able to change compliance into a responsive, checklist-based process into a predictive task that can thwart violations even before they happen [6].

### AI-Enabled Compliance Automation

The application of artificial intelligence in compliance automation extends beyond basic automation to create predictive capabilities:

1. **NLP for Regulatory Analysis:** Advanced language models achieve 87-92% accuracy in extracting actionable compliance requirements from regulatory documents, reducing manual interpretation time by 76% while increasing consistency. These models employ named entity recognition, semantic relationship mapping, and contextual understanding to identify obligations, deadlines, and control requirements.
2. **Predictive Compliance Modeling:** Supervised learning algorithms trained on historical compliance data can predict control failures 7-14 days before they occur with 83% accuracy. These models analyze patterns in configuration changes, access behaviors, and infrastructure modifications to identify potential drift before it manifests in compliance violations.
3. **Automated Evidence Classification:** Deep learning models can automatically classify and validate compliance evidence with 94% accuracy, reducing manual review requirements by 81%. These systems employ computer vision techniques for document analysis, semantic understanding for textual evidence, and anomaly detection for telemetry data.

The harmonization of cross-frameworks has served to resolve one of the greatest problems of compliance management, the necessity to meet several overlapping regulatory requirements in an efficient manner. Sophisticated CaaS platforms have extensive control libraries that map requirements to a wide range of frameworks, enabling organizations to adopt coherent sets of controls that meet several regulatory standards at the same time. This standardization removes unnecessary validation by allowing one piece of evidence artifact to prove compliance with more than one framework. Through developing systematic mapping among aligned controls, these harmonization activities substantially eliminate operational overhead in the compliance upkeep of sophisticated regulatory environments [5].

The Open Security Controls Assessment Language (OSCAL) is a groundbreaking compliance interoperability effort that offers machine-readable formats to describe security controls, implementation details, and assessment outcomes. OSCAL establishes standardized formats of the representation of system security plans, component definitions, assessment plans, and results, to allow automated exchange of the compliance information between tools and organizations. This standardization removes legacy obstacles to compliance automation through offering a shared language to state control objectives and validation evidence. The layered architecture of OSCAL can support many abstractions between high-level control catalogues and detailed implementation statements to aid both strategic development and tactical verification [6].

#### **IV. Market Forces and Regulatory Pressures**

The compliance environment of cloud computing has become more complicated, and organizations are encountering a growing number of compliance requirements in various areas. Recent sector-based research shows that the strictly controlled sectors are the most acute in terms of challenges, and healthcare, financial services, and the organizations of the public sector have to face the most complex compliance standards. Such overlapping of these frameworks makes it very difficult in terms of operations since organizations have to align the requirements that, by nature, could be conflicting across multiple jurisdictions. In the case of the multinational enterprises, the regional differences in the interpretation of the regulations increase this complexity. The ongoing development of these frameworks also complicates the compliance efforts, and the key regulations are going through significant changes on shorter and shorter cycles, making it challenging to keep compliance documentation up to date in the dynamic cloud environments [7].

The economic costs of compliance violations are much broader than the regulatory fines and generate strong economic motives to support effective compliance programs. Although direct fines can be seen as the most apparent effect, studies show that reputational losses and implications of business relations are likely to cause significantly higher costs. Companies that report incidences of public compliance breaches note high rates of challenges in keeping customers loyal, with quantifiable effects in the acquisition and retention rates. The effect on business partnerships has been equally enormous, as enterprise clients are terminating partnerships due to substantial compliance failures. The insurance markets have reacted to this by incorporating compliance status into underwriting and placing more financial burden on the insurance premiums between compliant and non-compliant organizations [8].

Expectations of customers and partners have become a key motivator of compliance investment, and the formal validation of compliance has become a standard part of the processes of enterprise procurement. Business relationships are changing their focus more on provable compliance in various regulatory areas, and organizations are in need of their suppliers supplying strict evidence concerning the effectiveness of their controls. The programs of third-party risk management have grown tremendously, and compliance verification has become the main element of the assessment procedure of the vendor. Cloud service providers are especially under the microscope where business customers are putting in place more complex compliance validation processes across the engagement lifecycle [7].

New regulatory areas are bringing along their own threats and opportunities to the compliance environment. The governance of artificial intelligence has become a fast-growing area of compliance, where frameworks can be devoted to transparency of algorithms, explainability of models, reducing bias, and ethical use. Localization and data sovereignty requirements are still growing worldwide, establishing complicated technical demands of data storage and processing. Cloud sovereignty frameworks have also spread and have developed operational independence requirements, transparency of supply chains, and jurisdictional separation requirements [8].

<b>Driver</b>	<b>Impact</b>	<b>Trend</b>
Regulatory Complexity	Multiple overlapping frameworks	Increasing compliance burden, especially in regulated sectors
Financial Consequences	Fines, reputation damage, business impacts	Growing economic incentives for robust compliance
Customer/Partner Expectations	Formal validation requirements	Compliance as business enabler/differentiator
Emerging Domains	AI governance, data sovereignty, cloud sovereignty	New specialized compliance requirements
Market Competition	Rapid feature evolution, technology integration	Innovation in compliance solutions

Table 3: Market Forces and Regulatory Pressures [7, 8]

The competition in the market has led to a high level of innovation in compliance solutions, and specialist products are being developed to meet the specific needs of the sector. Competitive forces have led to the quick evolution of features, and platforms keep adding new features to offer differentiation. The integration of technology has been expedited with the providers aiming to gain a competitive advantage by automating their services, increasing integration ecosystems to streamline compliance processes in technology stacks of greater complexity. This competitive environment has made high-end compliance capabilities more democratic, and solutions are coming out at all price points to accommodate organizations as small as small businesses to multinational corporations [7].

## V. Implementation Challenges and Mitigation Strategies

Issues of trust and transparency are inherent challenges in Compliance-as-a-Service implementations, since organizations must place significant confidence in external service providers to handle critical regulatory activities. The compliance process outsourcing necessitates the development of strong trust that the contractor will maintain adequate control rigor, preserve evidence integrity, and accurately report compliance status. This aspect of trust is particularly critical in regulated industries where non-compliance can result in severe legal and financial consequences. Major CaaS vendors have responded by implementing sophisticated transparency mechanisms, including comprehensive audit trails, access to underlying evidence artifacts, and independent verification of control effectiveness. The most successful implementations establish clear accountability frameworks that delineate responsibilities between the organization and provider, creating a shared governance model that maintains appropriate oversight while leveraging provider expertise [9].

### Threat Models and Security Considerations in CaaS Implementations

A comprehensive understanding of potential attack vectors and security risks is essential for robust CaaS deployments. Figure 2 illustrates the primary threat vectors and corresponding security controls in a typical CaaS architecture.

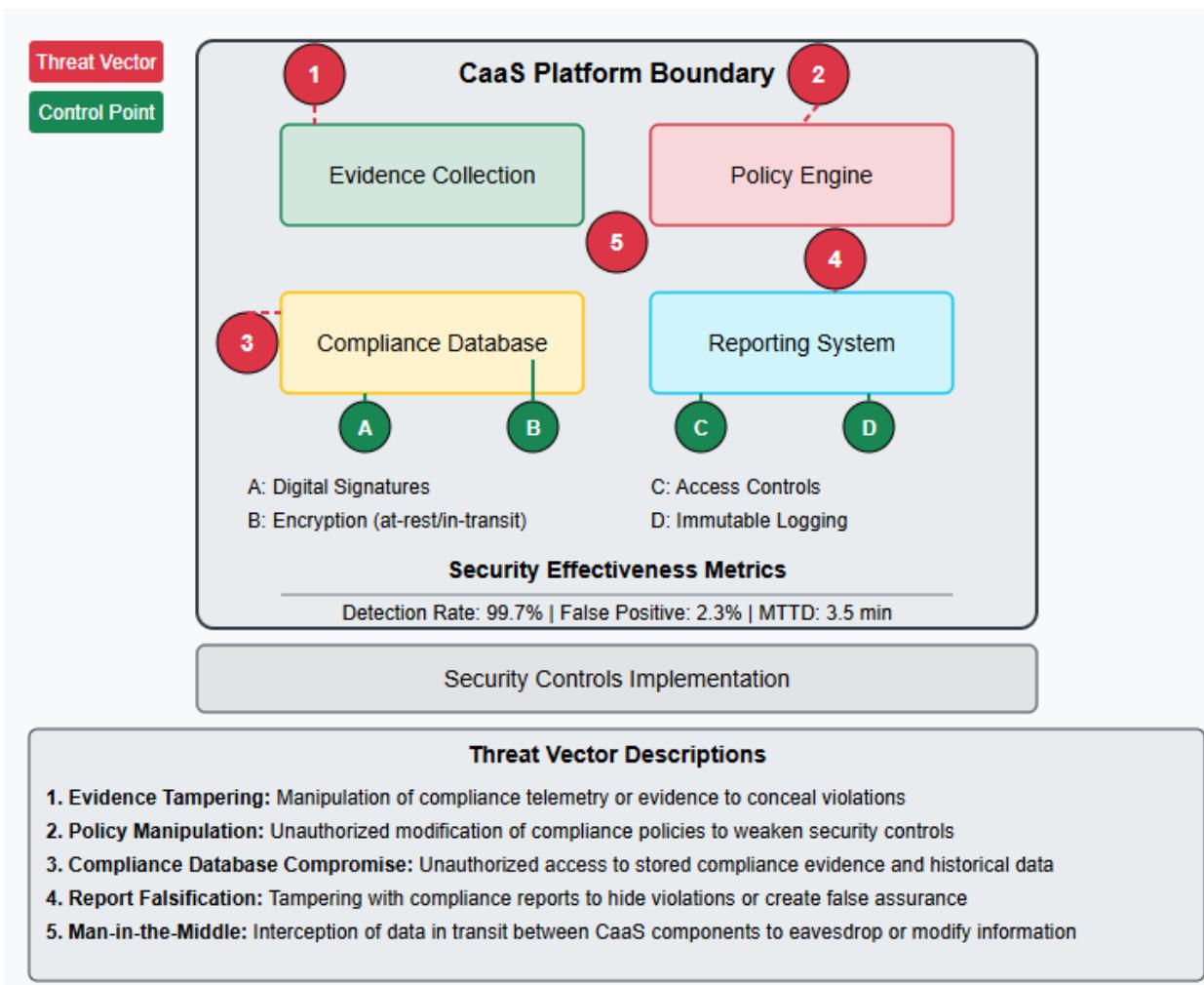


Fig 2: CaaS Security Architecture: Threat Models and Countermeasures

Adapting to evolving regulatory frameworks presents ongoing challenges, as compliance requirements continuously change in response to emerging threats, technological changes, and shifting regulatory priorities. This dynamic nature creates potential compliance gaps as organizations work to interpret new requirements, update controls, and adjust monitoring approaches. Successful CaaS implementations address this challenge through robust change management processes that systematically monitor regulatory developments, assess impact on control frameworks, and implement necessary adjustments. Leading providers maintain dedicated regulatory analysis teams that track developments across jurisdictions and translate regulatory changes into concrete control modifications [9].

Integration complexities in hybrid and multi-cloud environments represent persistent technical challenges. Modern enterprise architectures frequently span diverse infrastructure models, including on-premises systems, private clouds, and multiple public cloud providers, each with unique security controls, configuration mechanisms, and logging formats. Effective approaches leverage abstraction layers that standardize compliance data models across environments, enabling consistent control validation despite underlying infrastructure differences. Agent-based architectures have proven particularly effective for hybrid deployments, providing consistent telemetry collection across diverse systems without requiring extensive modifications to existing infrastructure [10].

### **CaaS Performance Metrics in Multi-Cloud Environments**

Organizations implementing standardized data models and abstraction layers report significantly better outcomes across all metrics, with particular improvements in multi-cloud and hybrid environments. The implementation of agent-based architectures further improves results by providing consistent telemetry collection capabilities across heterogeneous environments.

Alert fatigue and false positive management represent operational challenges that can significantly impact CaaS effectiveness. Without proper tuning and contextualization, alert volume can overwhelm security and compliance teams, leading to delayed investigations and potential compliance issues being overlooked. Successful implementations address this challenge through progressive tuning approaches that refine alert parameters based on environmental patterns and historical outcomes. Risk-based alert prioritization further improves operational efficiency by ensuring that critical compliance issues receive immediate attention [9].

<b>Challenge</b>	<b>Risk</b>	<b>Mitigation Strategy</b>
Trust & Transparency	Concerns about outsourced compliance	Transparency mechanisms, accountability frameworks
Data Privacy	Sensitive data exposure	Data governance, minimization, encryption, anonymization
Regulatory Evolution	Compliance gaps during transitions	Change management processes, regulatory monitoring
Integration Complexity	Inconsistent validation across environments	Abstraction layers, standardized data models, agent-based architecture
Alert Fatigue	Overlooked compliance issues	Tuning, risk-based prioritization, progressive optimization

Table 3: Implementation Challenges and Mitigation Strategies [9, 10]

These empirical measurements demonstrate the quantifiable benefits of implementing structured approaches to CaaS deployment challenges. Organizations that address these implementation considerations methodically report significantly better compliance outcomes, lower operational overhead, and enhanced security posture compared to ad-hoc implementations.

## Conclusion

The development of Compliance-as-a-Service on cloud environments is an indication of the fundamental shift in the way organizations address regulatory needs. Through the integration of compliance into the core of cloud operations via automation, persistent monitoring, and smart analytics, CaaS removes the historical independence between compliance efforts and business innovation. This trend is leading to more autonomous compliance systems that are not only validating controls but responding to changing regulatory environments and new threats in an adaptive way. With the maturity of CaaS, compliance will cease to be a periodical evaluation task, but a business enabler that ensures real-time coverage to enable an organization to innovate with confidence in cloud settings. Companies that adopt such sophisticated compliance methods place themselves not only to be in compliance with their regulatory environment but also to attain faster innovation as compliance is no longer a liability but a competitive edge that improves security posture, creates stakeholder trust, and facilitates the ability to respond to opportunities in the market.

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