

# RAG: To Build or not to Build?

That is the question. Explore the pros and cons of building versus buying a RAG solution for your organization.





## **Contents**

Introduction	1
The Benefits of RAG for Enterprises	2
The Hidden Complexity of RAG Implementation	2
<ul> <li>Key Challenges in RAG System Development</li> </ul>	2
Security Risks in RAG Systems	3
The True Cost of RAG Systems	3
Infrastructure Costs	4
Personnel Costs	4
Ongoing Maintenance Costs	4
Conclusion	4



### **RAG: To Build or Not to Build**

As AI continues to evolve, its role in business is no longer a matter of "if" but "when." Enterprises worldwide recognize the need to adopt AI-driven solutions like Retrieval-Augmented Generation (RAG) to stay competitive. But once they decide to move forward, the next critical question arises:

"Should we build or buy?"

This white paper will help your organization make an informed decision by evaluating the costs, risks, and strategic considerations of both options.

### INTRODUCTION

As enterprises accelerate their adoption of generative AI, many IT teams are exploring Retrieval-Augmented Generation (RAG) to enhance knowledge retrieval.

While building a custom RAG-based system may seem attractive, it comes with significant challenges, including high infrastructure and personnel costs, security risks, and ongoing maintenance demands.

This white paper examines the hidden costs and complexities of developing an in-house RAG system versus adopting an enterprise solution.

By informing you about all the costs and considerations when building your own RAG, we hope to allow organizations to make an informed decision about whether to build or buy.

Building in-house offers flexibility for highly specialized needs and control over data security, while buying allows organizations to benefit from the scalability, security, and lower operational burden of commercial RAG platforms.



### The Benefits of RAG for Enterprises

RAG enhances knowledge retrieval by combining the reasoning capabilities of large language models (LLMs) with the accuracy of enterprise-specific data.

Unlike traditional search or standalone Al models, RAG improves response relevance, reduces hallucinations, and enables realtime access to up-to-date information.

This makes it particularly valuable for industries that require fast, accurate, and context-aware insights, such as customer support, legal research, and healthcare.

By leveraging RAG, enterprises can boost productivity, enhance decision-making, and unlock new efficiencies across various business functions.

### **Key Benefits of RAG for Enterprises:**

- Improved Response Accuracy
  RAG reduces AI hallucinations by grounding responses in trusted enterprise data.
- Real-Time Information Retrieval
  Unlike traditional AI models, RAG can pull
  from live documents and databases.
- **Higher Efficiency & Productivity**Reduces time spent searching for information, allowing employees to focus on high-value tasks.



# THE HIDDEN COMPLEXITY OF RAG IMPLEMENTATION

At a glance, building a RAG-based AI system may seem straightforward—combine a language model with a knowledge base, and you're done.

However, real-world deployment introduces significant challenges in engineering, security, and operations. Many organizations underestimate the effort required to scale, secure, and maintain an enterprise-grade RAG system.

What begins as a simple prototype will evolve into a multi-faceted engineering project that requires continuous oversight.

### Key Challenges in RAG System Development

• Data Ingestion & Integration Complexity
Connecting and normalizing data from
multiple sources (e.g., SharePoint, Google
Drive, internal repositories) requires extensive
ETL pipelines.

#### • File Format Standardization

Ensuring accurate retrieval across structured and unstructured data (PDFs, databases, emails) introduces technical inconsistencies.

### • Scalability & Performance

As datasets grow, retrieval speed and accuracy often degrade without proper indexing and optimization.

### • Hallucination Mitigation

Al-generated misinformation requires ongoing fine-tuning, human validation, and robust governance policies.

- Real-Time Data Synchronization Keeping information up to date requires continuous indexing and refresh cycles.
- Enterprise System Integration RAG solutions must seamlessly connect with CRMs, document management tools, and legacy IT systems.

### **Security Risks in RAG Systems**

Security risks are another major challenge in RAG implementation, especially in industries that handle sensitive or proprietary data.

Without proper safeguards, these systems can introduce vulnerabilities that compromise data privacy, compliance, and trust.

### • Data Leakage

RAG models can inadvertently expose confidential or proprietary information if not properly secured.

#### Adversarial Attacks

Prompt injection and model manipulation techniques can exploit vulnerabilities, causing misinformation or security breaches.

### • Lack of Explainability

Al-generated responses must be auditable and traceable to meet regulatory and compliance requirements.

### • Regulatory Compliance Risks

Enterprises handling personal data must adhere to GDPR, HIPAA, SOC 2, and industry-specific regulations.

### • Access Control & Permissions

Without strict user access policies, unauthorized individuals may retrieve sensitive data. Enterprise-grade RAG solutions mitigate these risks through robust security frameworks, compliance tracking, and controlled access mechanisms—features that are costly and time-consuming to build from scratch.

# THE TRUE COST OF RAG SYSTEMS

Many assume building a RAG system is as simple as fine-tuning an AI model with a database. However, an enterprise-grade RAG solution requires ongoing infrastructure, security hardening, and compliance.

It is a complex system, and the costs reflect that. Some organizations believe that leveraging open-source RAG frameworks and vector databases will help provide a cost-effective alternative to purchasing an enterprise solution.

However, the true costs of building an internal RAG system extend far beyond software licensing.



### **Infrastructure Costs**

### • Compute resources

High-performance GPUs (e.g., NVIDIA A100, H100) or cloud-based inference services

### Storage

Vector databases and/or graph databases and scalable storage solutions

### Performance monitoring and observability tools

Tools for logging, tracking model performance, and anomaly detection

### • Backup and disaster recovery systems: Ensuring data reliability and uptime

#### Network bandwidth

Costs for data transfer between storage, model inference servers, and user-facing applications, especially in cloud or distributed deployments.

### **Personnel Costs**

Machine Learning Engineers	\$163,390/year
DevOps Engineers	\$126,702/year
AI/IT Security Specialists	\$110,737/year
IT Project Managers	\$105,465/year

Source: Indeed

### **Ongoing Operational Costs**

- 24/7 monitoring and incident response
- API usage fees (e.g., OpenAI, Anthropic, proprietary LLMs)
- Model versioning and upgrades
- Compliance audits and regulatory update
- Continuous optimization and performance tuning

### CONCLUSION

Deciding whether to build or buy a RAG system is more than just a technical choice, it affects cost, security, and long-term scalability. While an in-house system offers deep customization, a commercial solution typically results in a lower total cost of ownership (TCO) and faster deployment. We suggest:

### **Build your own RAG system if:**

- You have highly specialized AI needs that commercial solutions cannot fulfill.
- You have the time, budget, and expertise to support ongoing development and maintenance.
- You require full control over data security and can maintain those protections inhouse.

### Buy a commercial RAG solution if:

- You need a secure, enterprise-ready solution with minimal setup time.
- You want predictable costs, lower maintenance overhead, and scalable infrastructure.
- You prefer to focus on business outcomes rather than managing AI infrastructure.

While building an in-house RAG system may seem appealing, organizations often underestimate the hidden complexities, security risks, and long-term costs.

Many enterprises find that a commercial solution delivers greater efficiency, security, and scalability—without the burden of continuous development and maintenance.

Gemini Enterprise is just one example of a platform that allows your business to harness the power of Al without the risks and overhead of an in-house build.

Instead of managing infrastructure, you can focus on leveraging AI for real business impact.



### **GEMINI ENTERPRISE**

If you are looking for a *simple, secure, and trustworthy* commercial RAG solution, look no further than **GEMINI ENTERPRISE** 

# YOUR BUSINESS, YOUR DATA IS NOW AI-POWERED

Gemini Enterprise is the world's first enterprise-grade Hybrid RAG AI Assistant Platform, enabling your organization to store your data in both a vector and a graph format, offering a simple, secure, and trustworthy generative AI experience to accelerate enterprise rapid decision making.

By using a Hybrid RAG approach, Gemini Enterprise **greatly reduces AI hallucination** by creating the greatest semantic layer of understanding of your data, both structured and unstructured.

The Hybrid RAG approach also ensures the **greatest accuracy** to your Al-generated answers, in addition to being **explainable** and transparent.

### GEMINI ENTERPRISE KEY FEATURES

- Connect Your Data to Al Fast
- No-Code
- Conversational AI Experience
   Made Easy
- Generate Comprehensive Al Reports
- Role-Based Access Controls for Your Projects

**Embrace the Al-driven future now with Gemini Enterprise.** Contact us for a personalized demo or visit our website at geminidata.com for more details.





geminidata.com

COMPLIANCE

FASTER REACH

BIG DATA
INTELLIGENCE

COMPETTIVE ADVANTAGE

•

COST EFFICIENCY

CUSTOMER

+1 800 549 7888

Our mission is to redefine how data is used, analyzed, and shared. We've built the world's simplest enterprise AI assistant platform to help companies all over the world connect the dots and get answers faster, respond to unusual events, and take the next best action.

Amsterdam | Irvine | San Diego San Francisco | Taipei | Tokyo

**About Gemini Data**