

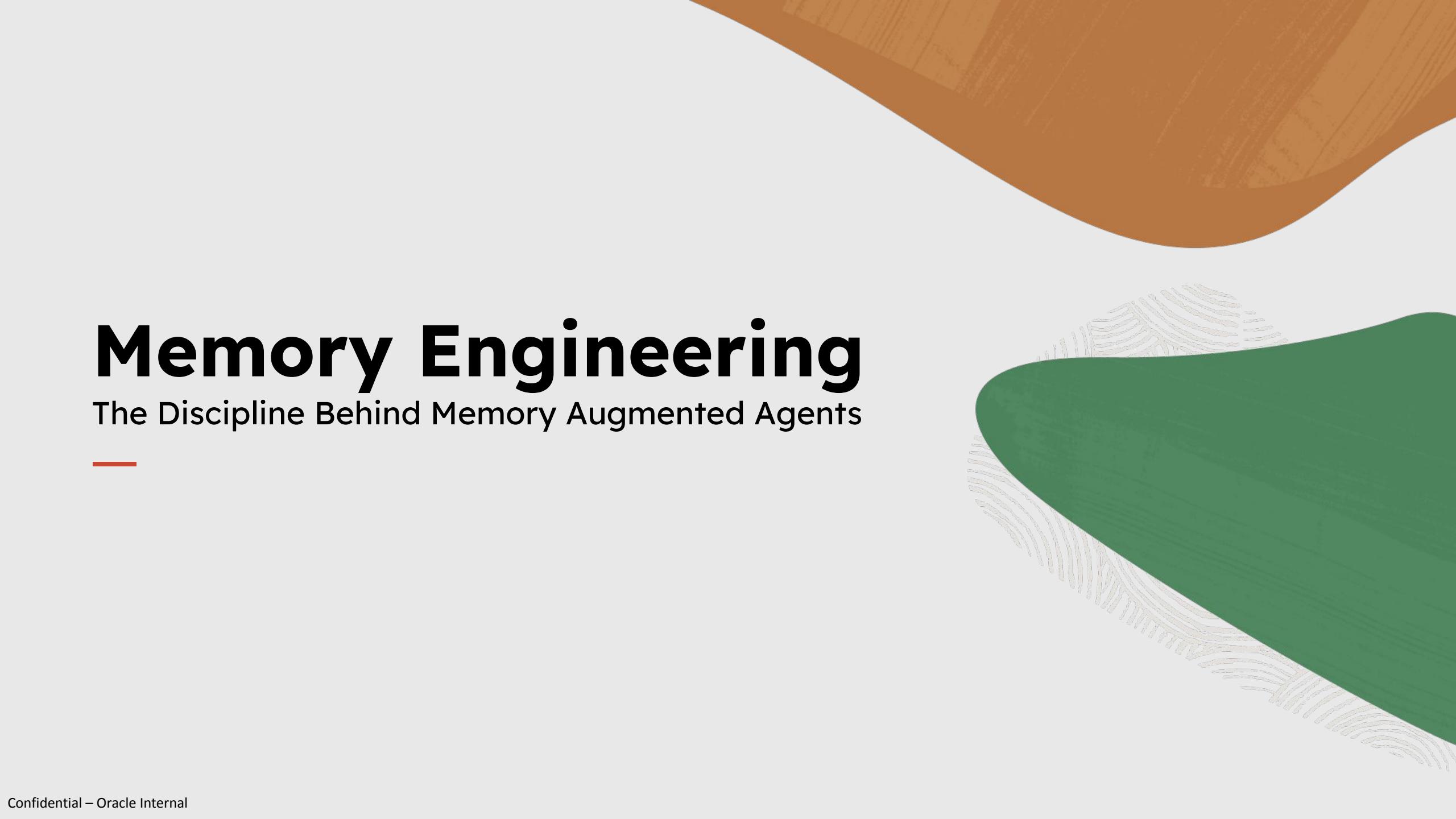
# JOURNEY

---

# **Memory Engineering**

The Discipline Behind Memory Augmented Agents

---



# Richmond Alake

Director, AI Developer Experience  
Oracle Database



## Agent Memory and Memory Engineering

On a mission to make Memory Engineering a recognized discipline in AI. It's how I think about the science of helping agents remember, reason, and act — and it's what I build every day through MemoRizz and my #100DaysOfAgentMemory series.



# Richmond Alake

Director, AI Developer Experience  
Oracle Database



**Writer | Educator | Speaker**

Written 200+ articles, clocked over a million views, and spoken at conferences around the world. My goal is simple — take the hardest ideas in AI and make them accessible to every developer.

# Richmond Alake

Director, AI Developer Experience  
Oracle Database



## AI Developer

I don't just talk about this stuff. I build it. From open-source tools to supporting developers in large enterprise organization in developing and deploying AI systems, I bring an engineer's mindset to everything I do.





# JOURNEY

---

- Ecosystem
- Form Factor
- Disciplines

# JOURNEY

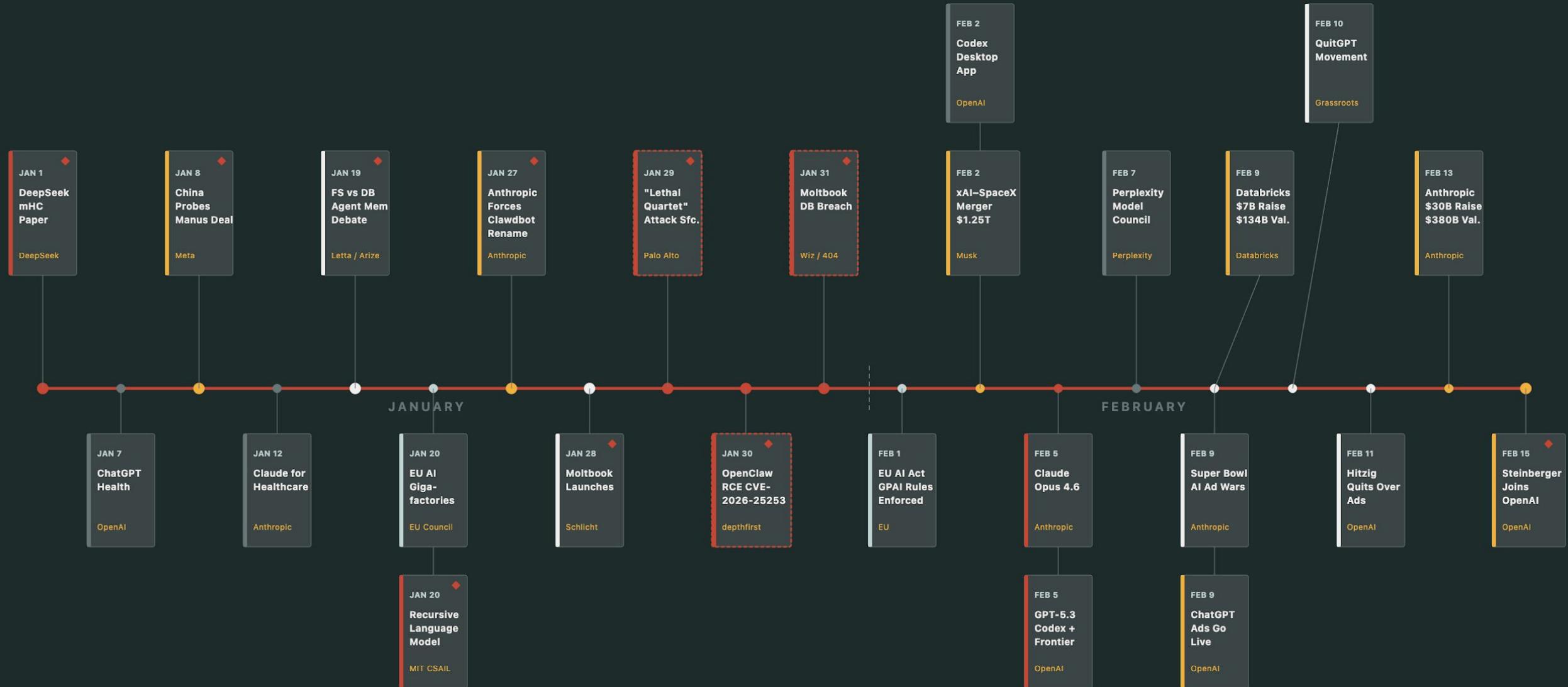
---

Ecosystem

Form Factor

Disciplines

# AI Industry Timeline — January to February 2026



# IT IS ONLY FEBRUARY

*The speed of development of AI this past few years is just breathtaking. I know everyone, whether we pretend or not, everyone deep in your heart is feeling that anxiety of there's just too much to read, too many blogs, too many news, too many model releases, too many and and that sense of anxiety is is speaks of our time is that this technology is just moving as at a breathtaking speed.*

*So that's that gives me a lot of excitement but also keeps me very grounded about how little I know. You know this famous saying I don't know anything and someone like me even feels that and I want you to at least hear this from me and recognize we all feel that and don't give up your learning and continue to be curious*

**Fei-Fei Li**



# JOURNEY

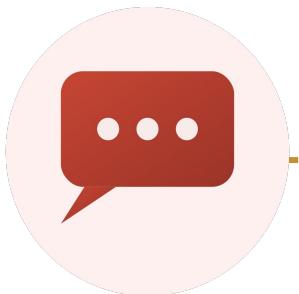
---

Ecosystem

**Form Factor**

Disciplines

# Form Factors and Maturity Levels



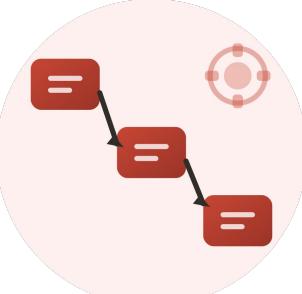
## LLM Chatbots

Single-turn or multi-turn **conversational interfaces** powered by large language models. Minimal context retention, best suited for Q&A, summarization, and general assistance



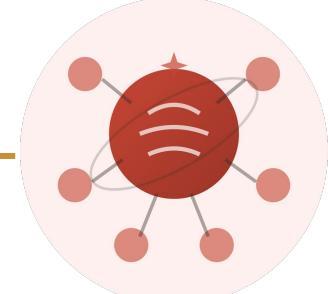
## RAG Applications

LLM **responses grounded** in your organization's data through retrieval-augmented generation. Connects models to internal knowledge bases for accurate, domain-specific answers.



## LLM-Driven Workflows

Multi-step processes orchestrated by LLMs within human-defined logic. **Automates** structured tasks like document processing, approvals, and data transformation with predictable outputs.



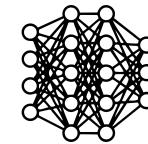
## Agentic AI

**Autonomous** systems that plan, reason, use tools, and make decisions with minimal human intervention. Maintain persistent memory and adapt dynamically to accomplish complex goals



## LLM Chatbots

Single-turn or multi-turn **conversational interfaces** powered by large language models. Minimal context retention, best suited for Q&A, summarization, and general assistance



**Large Language Model**

Embedded LLMs

Natural language output

Response generation

Parametric memory

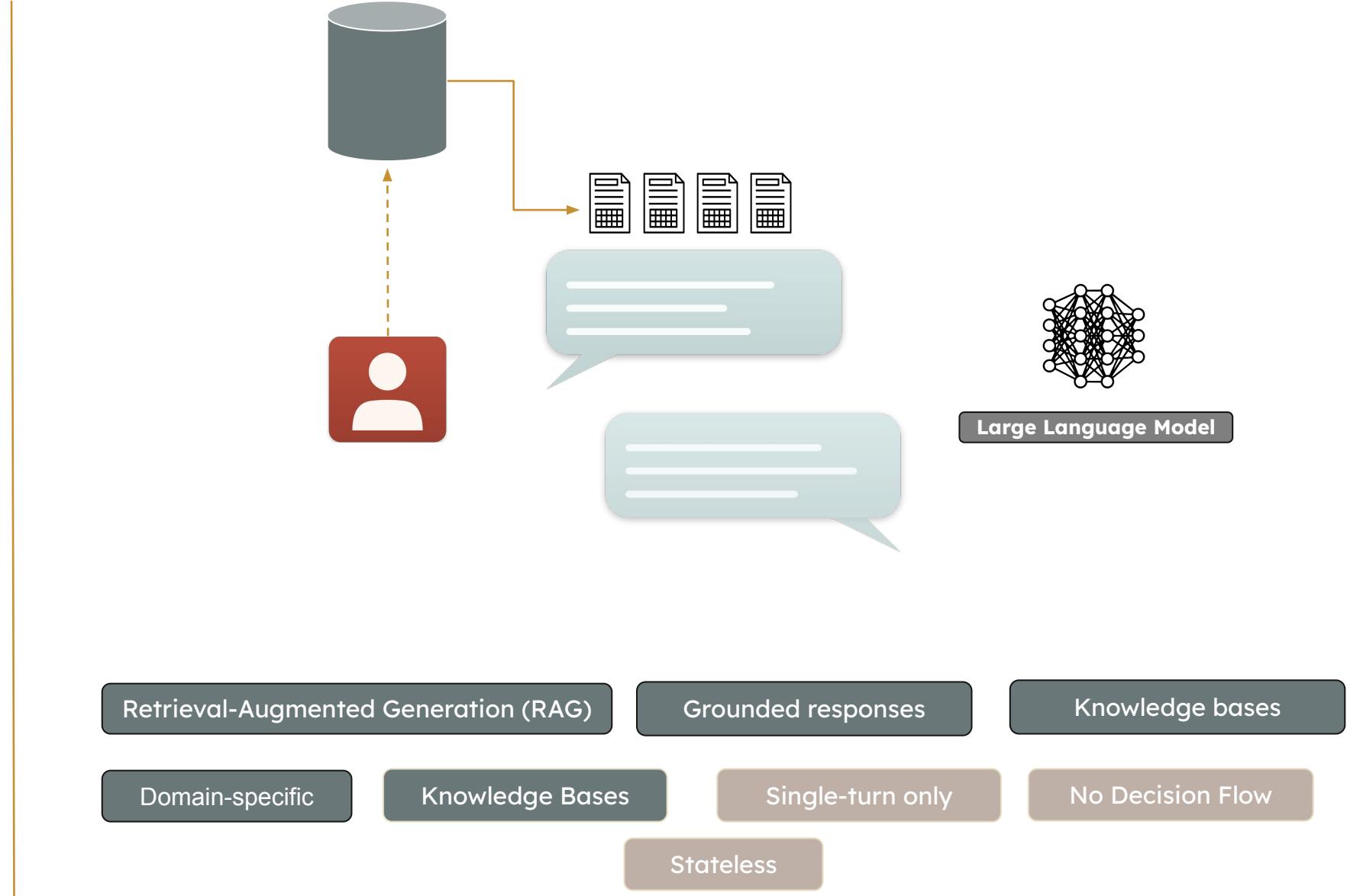
Outdated responses

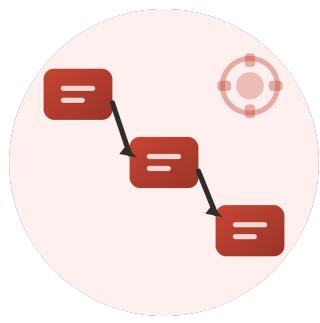
Hallucination



## RAG Applications

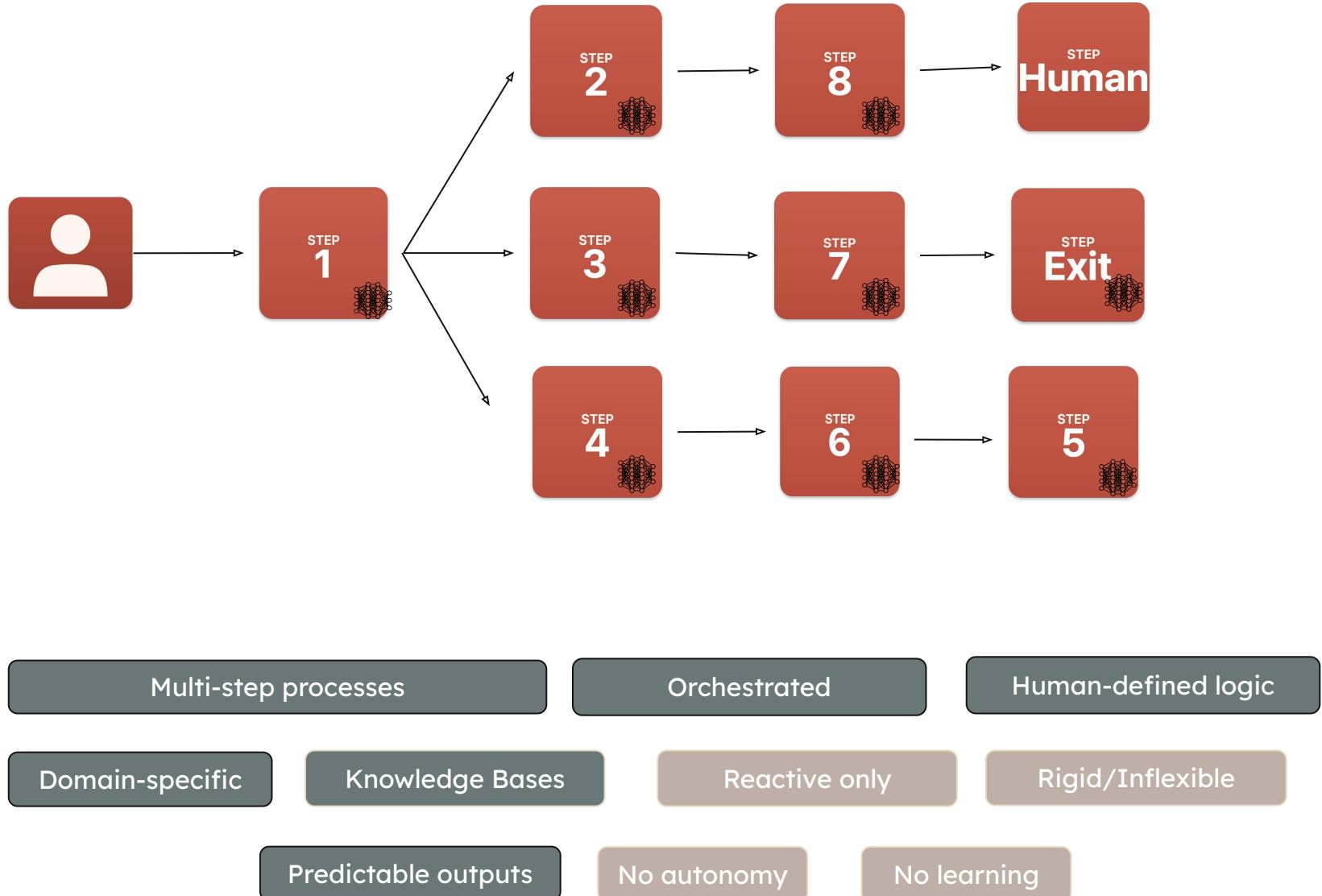
LLM responses grounded in your organization's data through retrieval-augmented generation. Connects models to internal knowledge bases for accurate, domain-specific answers.





## LLM-Driven Workflows

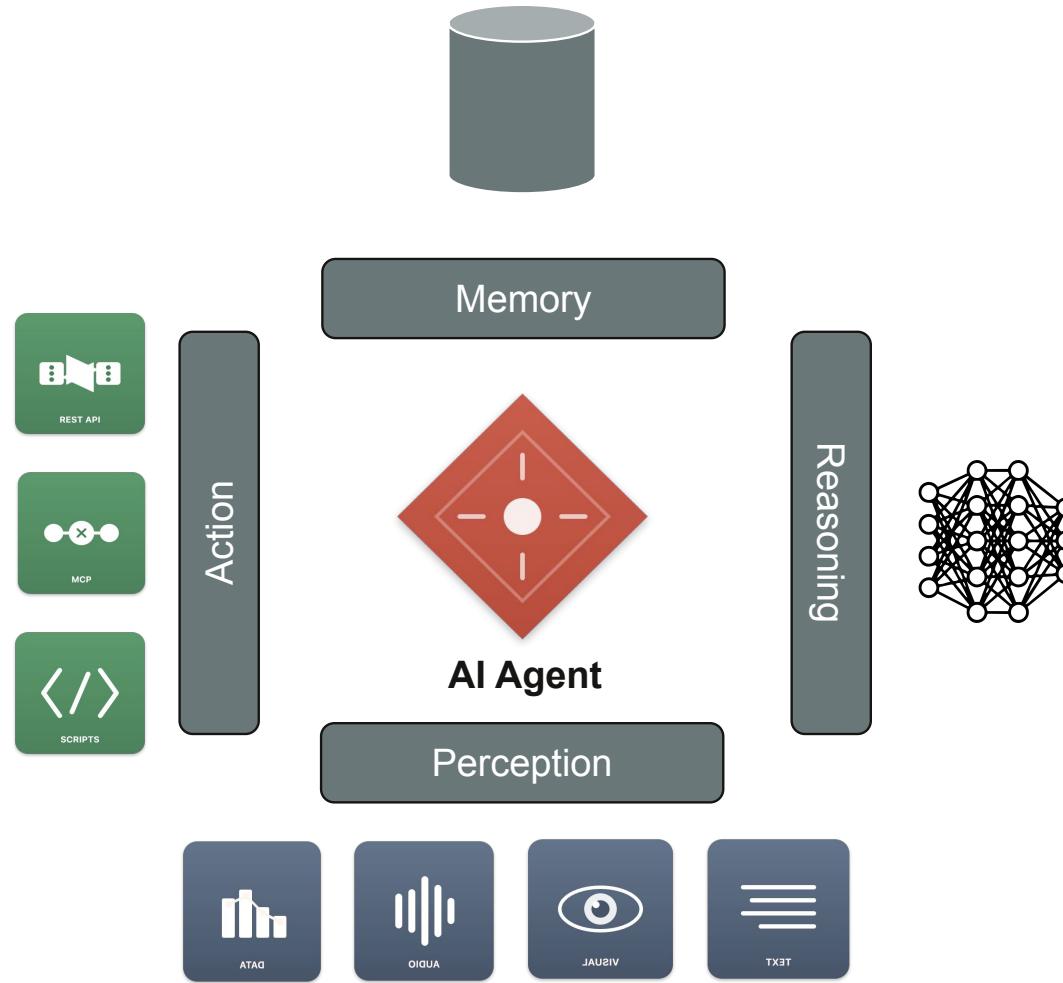
Multi-step processes orchestrated by LLMs within human-defined logic. **Automates** structured tasks like document processing, approvals, and data transformation with predictable outputs.





## Agentic AI

**Autonomous** systems that plan, reason, use tools, and make decisions with minimal human intervention. Maintain persistent memory and adapt dynamically to accomplish complex goals





# JOURNEY

---

- Ecosystem
- Form Factor
- Disciplines**

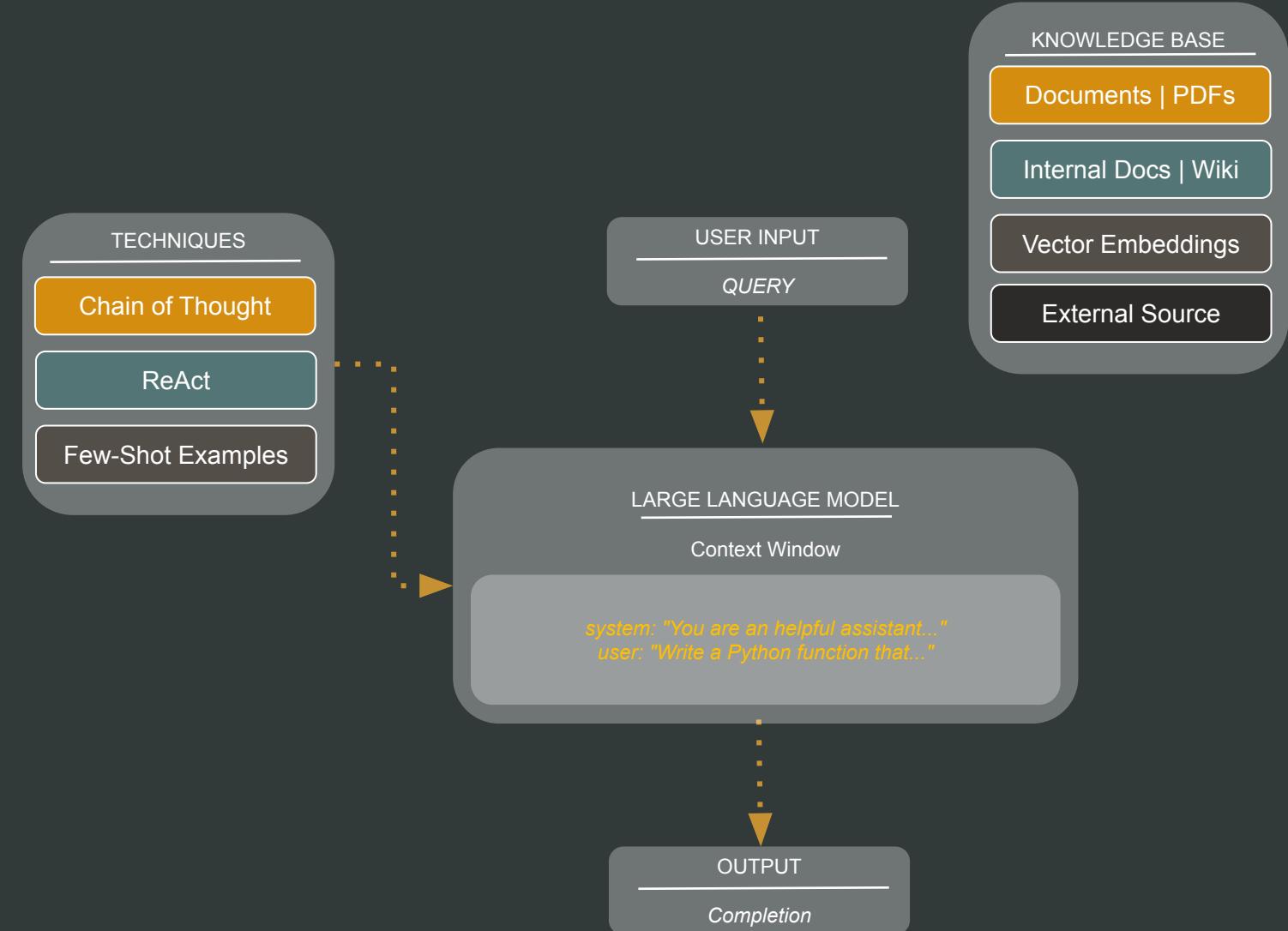
Prompt Engineering

Context Engineering

Memory Engineering ?

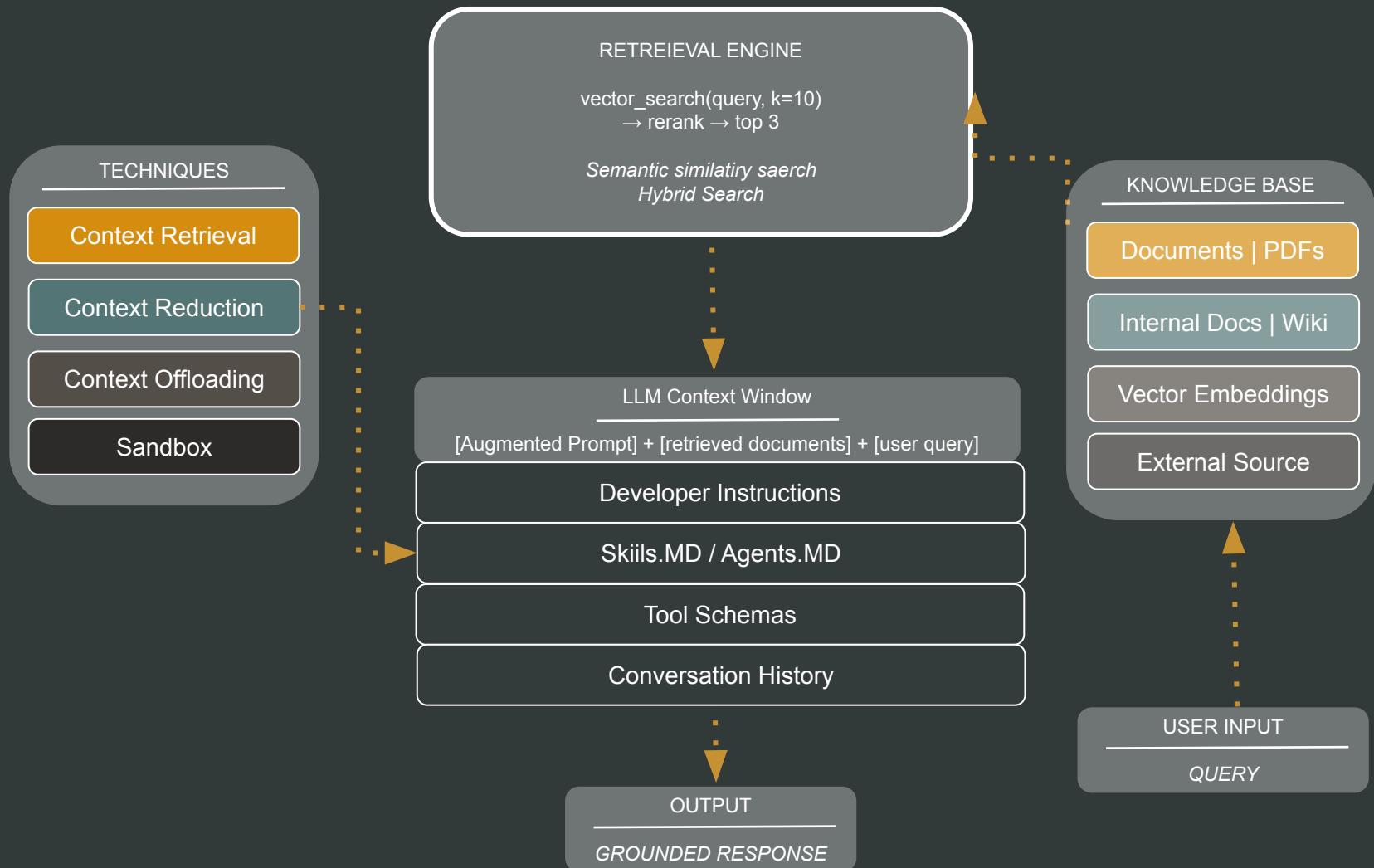
# Prompt Engineering

The utilization of **linguistic patterns and language modification to maximize** the input provided into an LLM in order to illicit a desired behavior and output



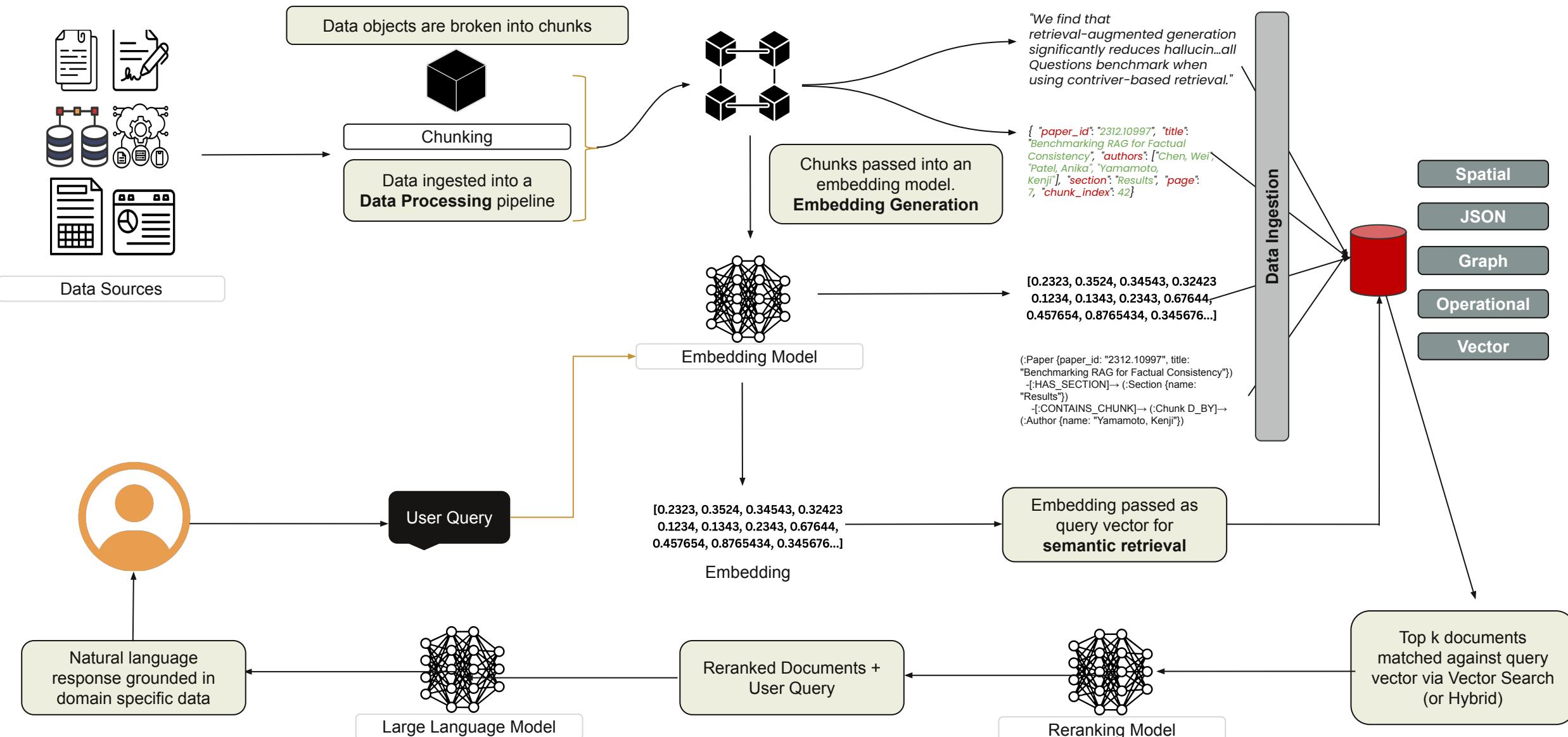
# Context Engineering

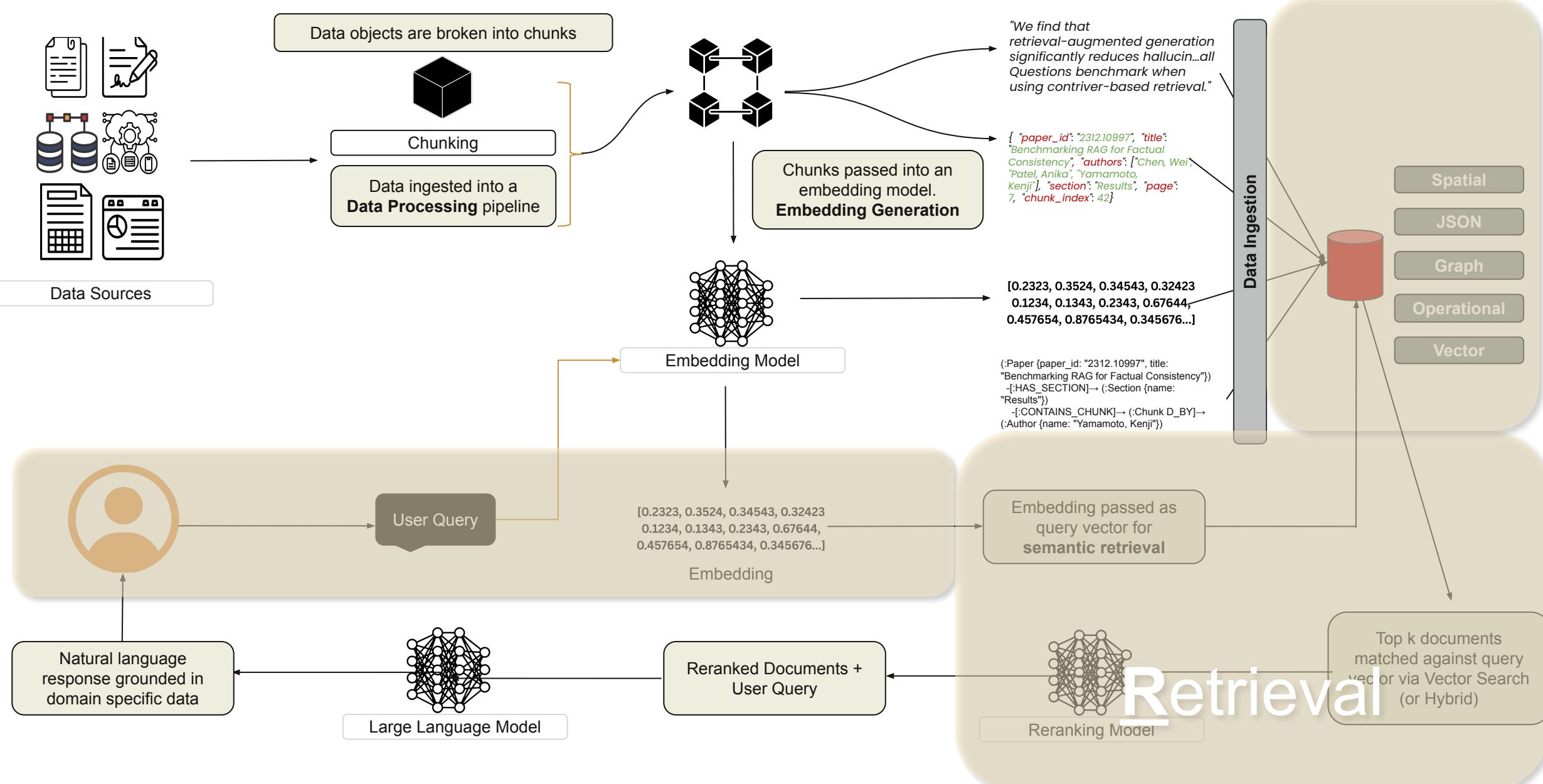
The practice of selecting, structuring, and prioritizing tokens within a finite context window, optimizing the signal-to-noise ratio of inputs to reliably produce desired model behavior.

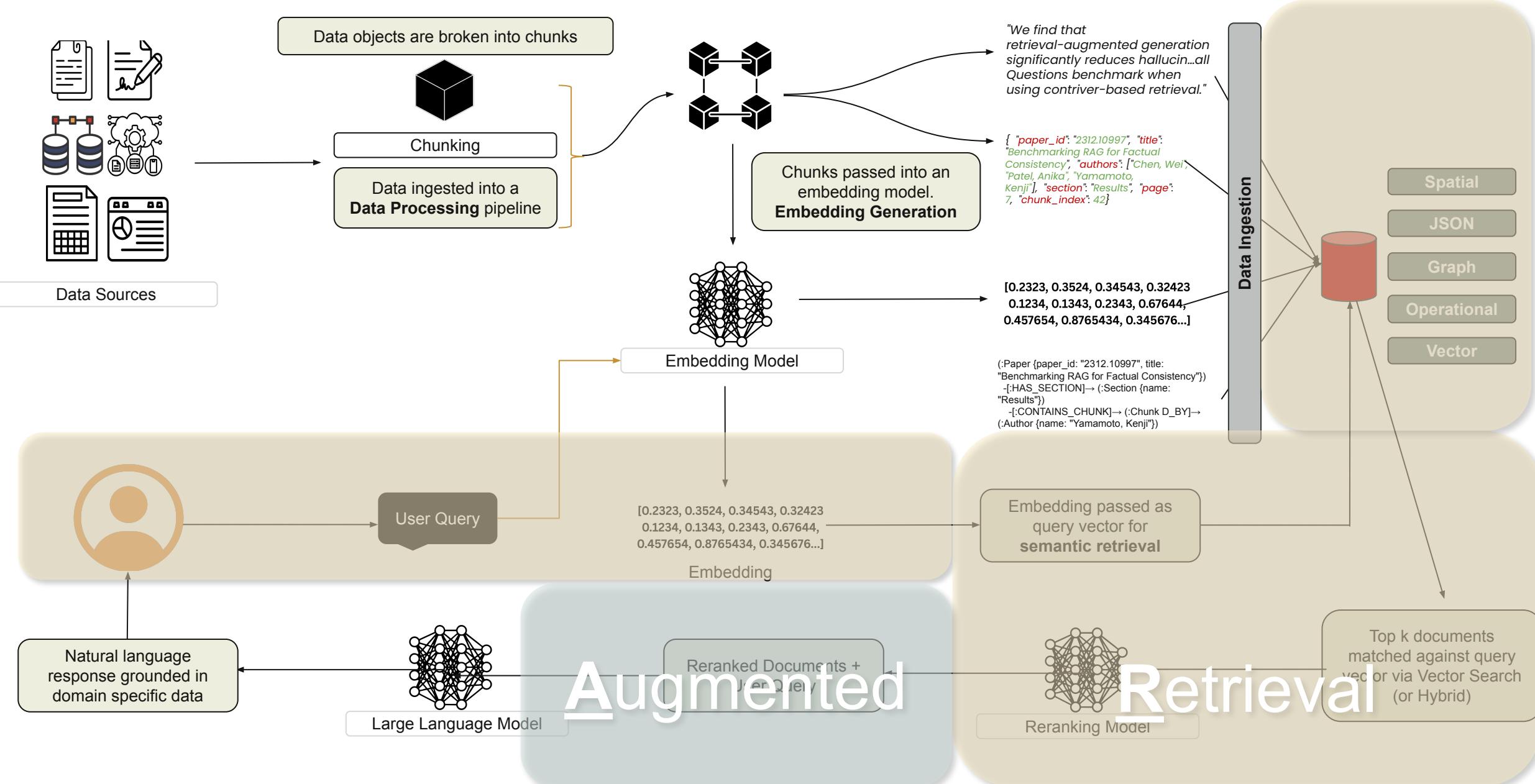


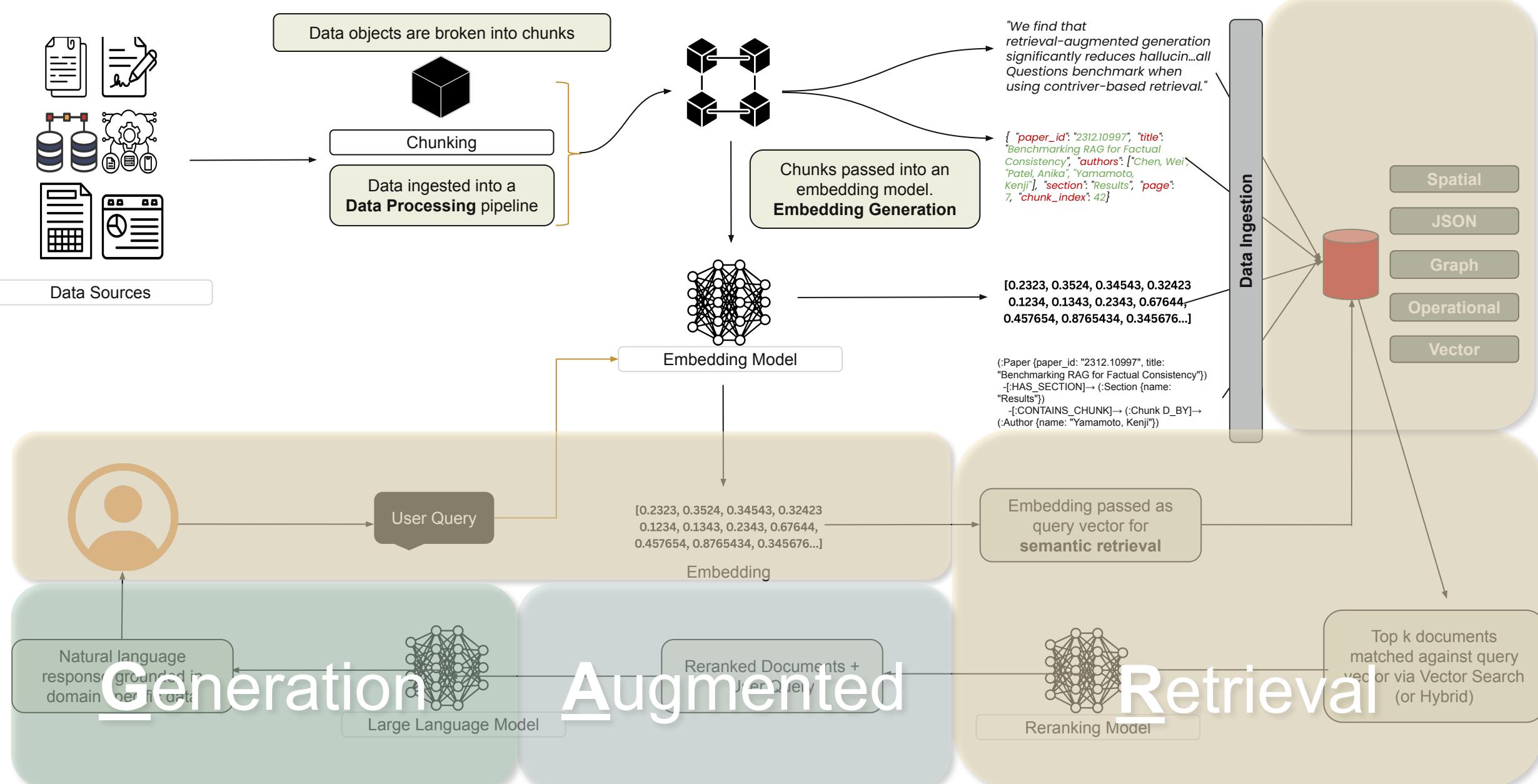
# Agent Memory

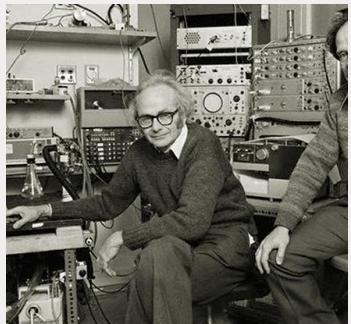
---











## David Hubel and Torsten Wiesel

Neurophysiologists who won the 1981 Nobel Prize for mapping the visual cortex, discovering how neurons process images. They identified simple/complex cells that detect visual edges



### System 1

Operates quickly, effortlessly, and without conscious deliberation. It handles things like recognizing faces, understanding simple sentences, driving on an empty road, or catching a ball. It relies on heuristics, pattern recognition, and intuition.

243x942

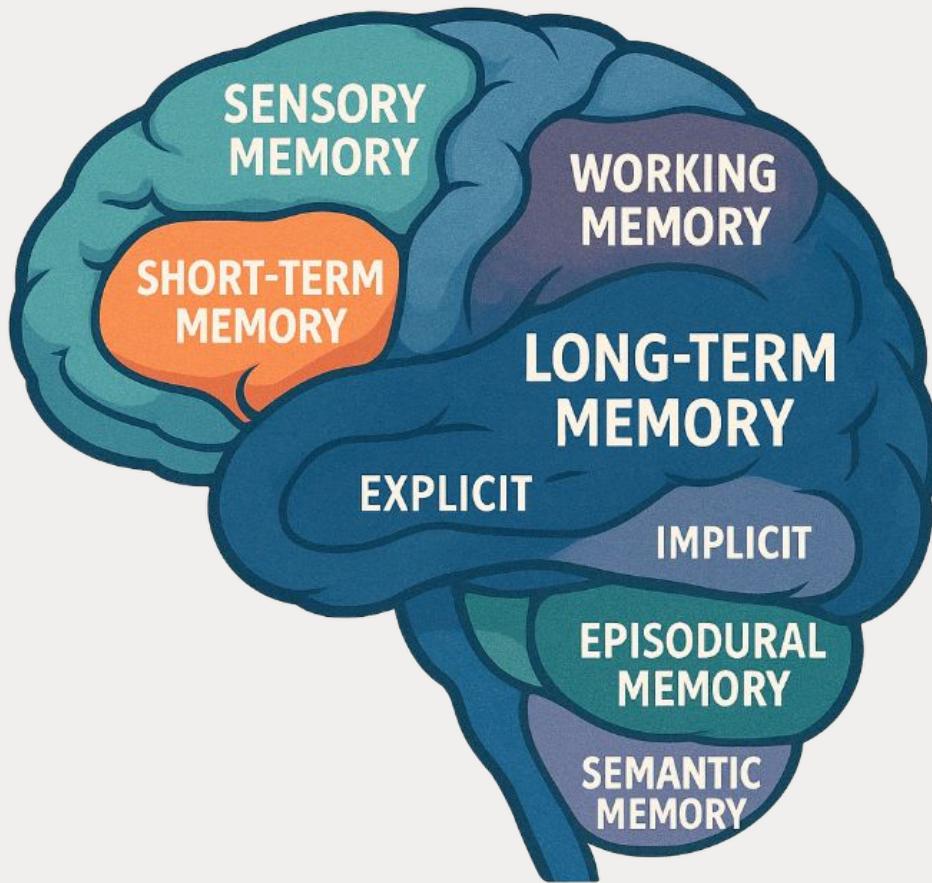
### System 2

Slow, deliberate, and analytical. It's what you engage when solving a complex math problem, comparing two products with different features, or carefully planning a project.



## Lilienthal's Glider in Flight

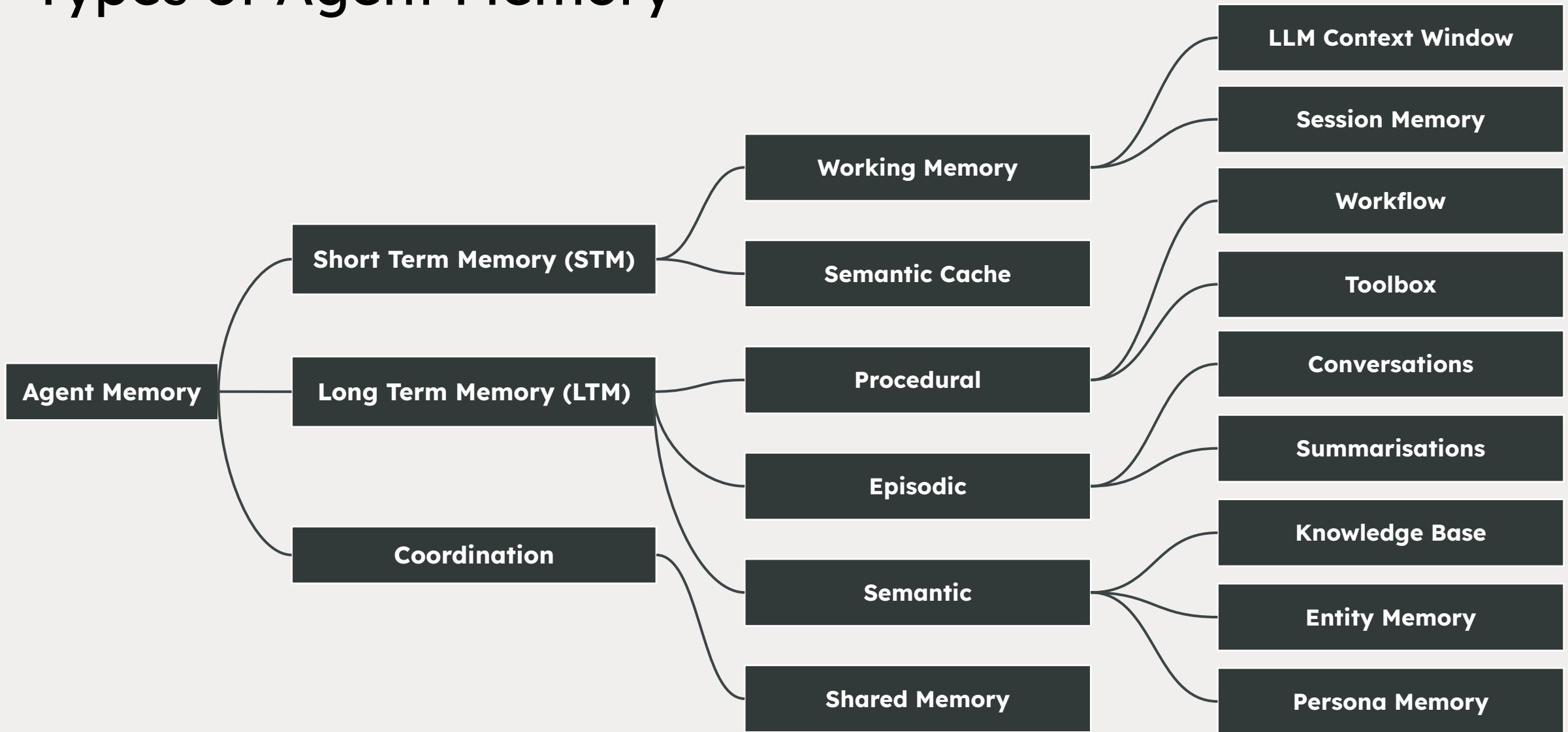
Otto Lilienthal's work on flight was deeply inspired by birds. He studied their wing mechanics and used their mechanisms of flight as the foundation for building controllable flying vehicles. His book, *Birdflight as the Basis of Aviation*, went on to become a key influence on the Wright brothers' own pioneering work.

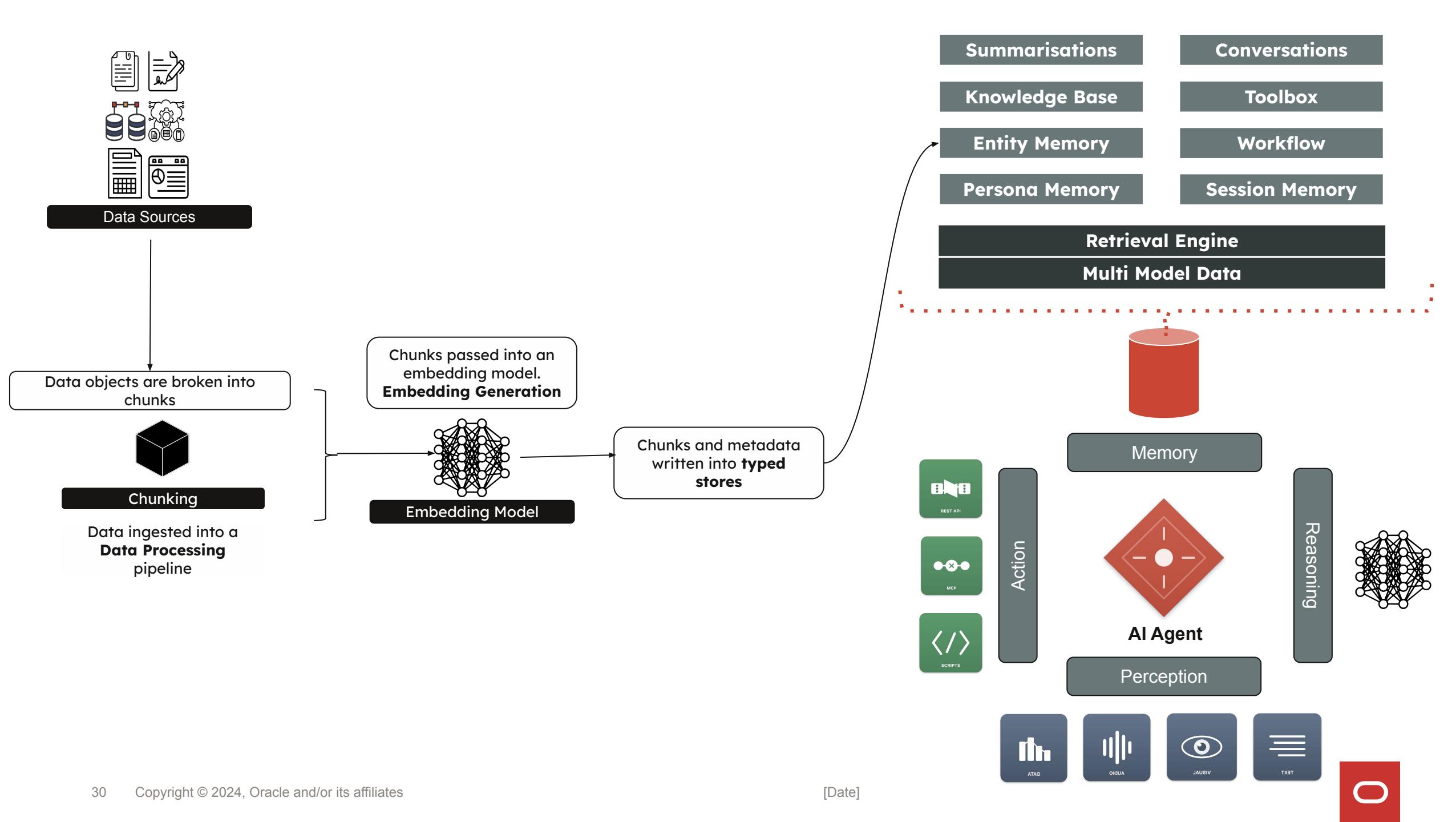


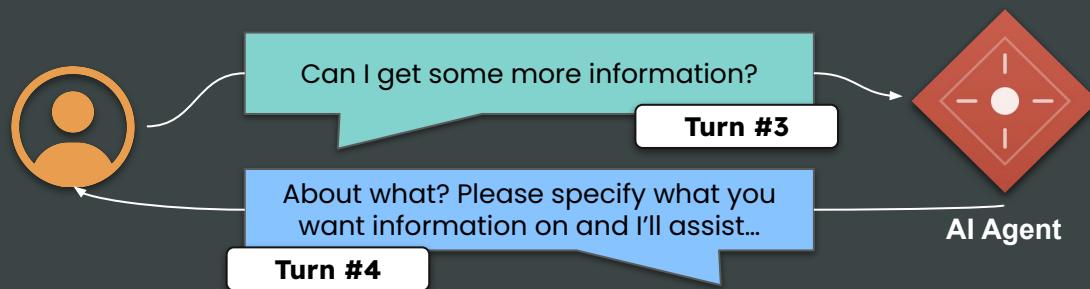
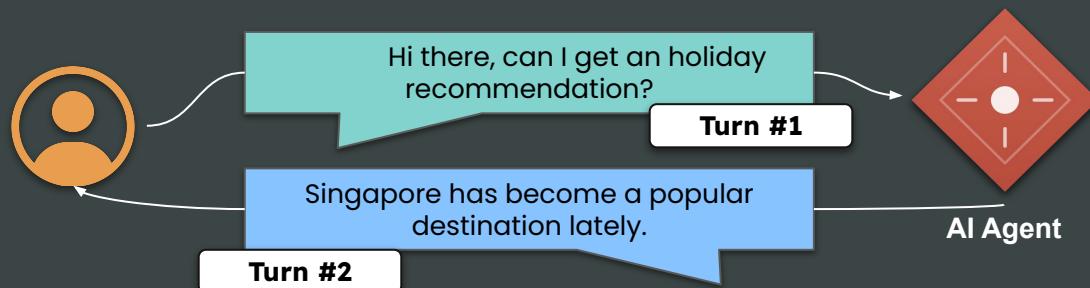
Humans have a good ability to  
**retain, recall** and **reuse**  
information over **short and long**  
**period** of time.



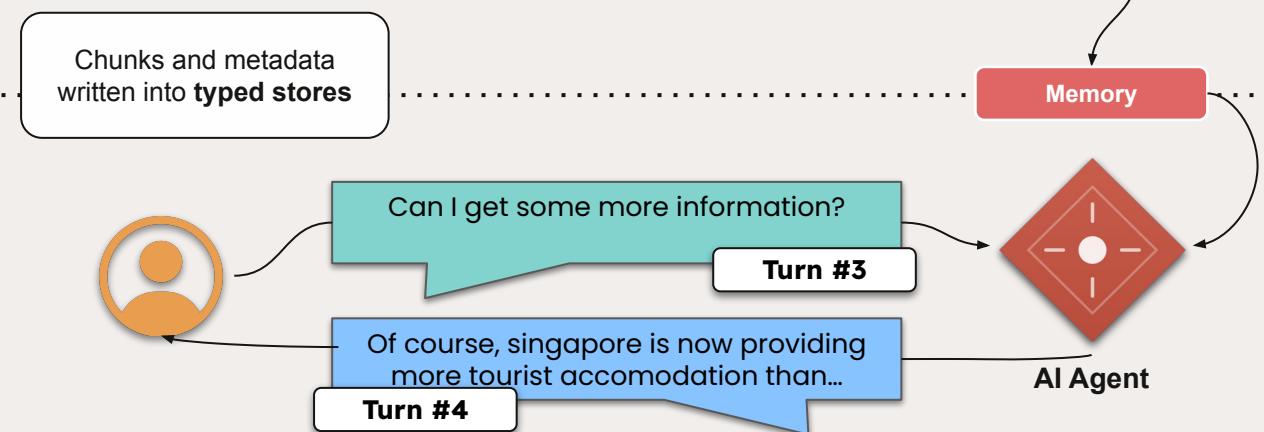
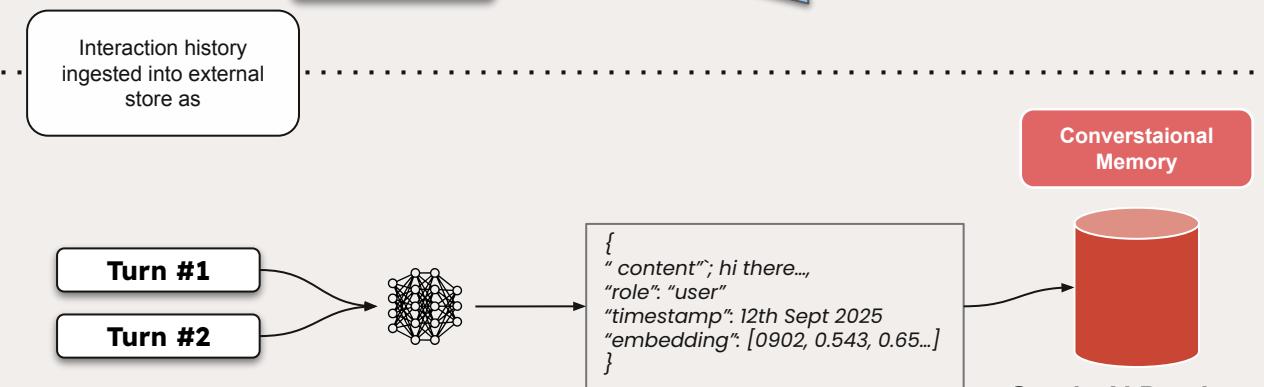
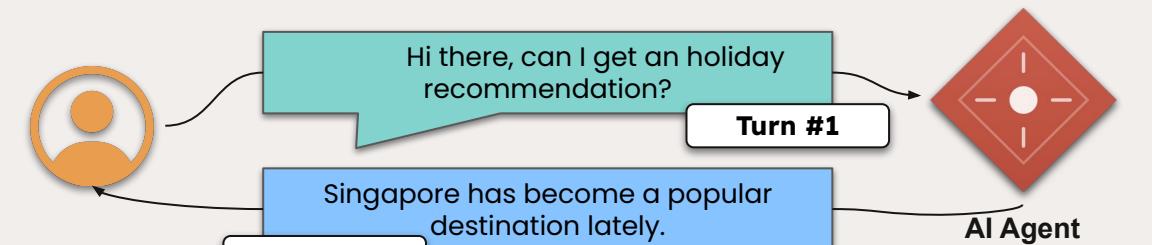
# Types of Agent Memory







Stateless Agent



Memory Augmented Agent

# Agent Memory

---

A computational exocortex for AI agents made up of a dynamic, systematic process that integrates an agent's LLM memory (context window and parametric weights) with a persistent external memory management system.

This process relies on three core components working in concert: the LLM for reasoning and synthesis, an embedding model for encoding information into vector representations that enable semantic retrieval, and a database for persistent storage and retrieval. Together, these enable an agent to accumulate knowledge, maintain continuity across interactions, and adapt its behaviour based on historical patterns.

# **Agent Memory Signals**

---

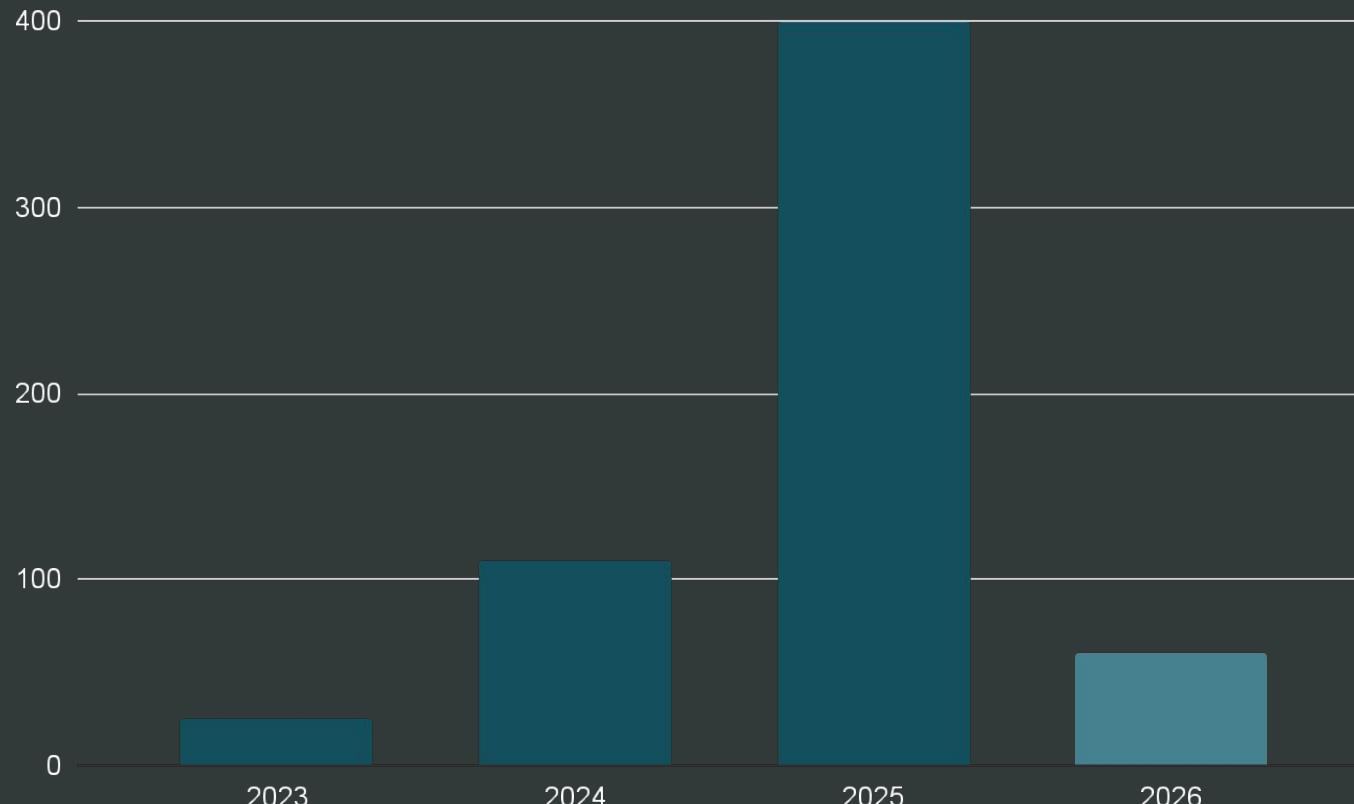
Research

Open Source

Industry

Research Volume Signal

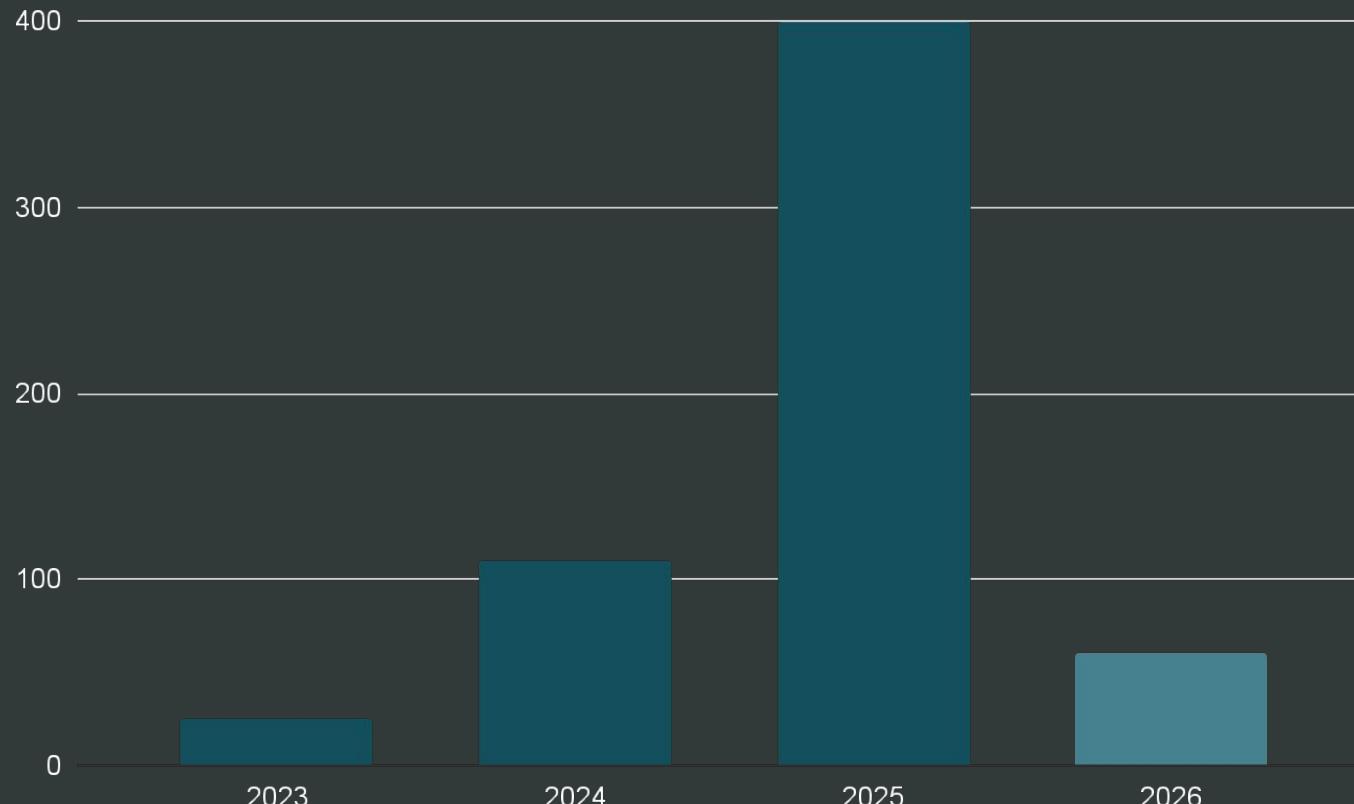
# Papers on Agent Memory Went From Niche to Critical



15x growth in 2 years

Research Volume Signal

# Papers on Agent Memory Went From Niche to Critical



16x growth in 2 years

## Generative Agents: Interactive Simulacra of Human Behavior

Joon Sung Park  
Stanford University  
Stanford, USA  
joonspk@stanford.edu

Meredith Ringel Morris  
Google DeepMind  
Seattle, WA, USA  
merrie@google.com

Percy Liang

Joseph C. O'Brien  
Stanford University  
Stanford, USA  
jobrien3@stanford.edu

Carrie J. Cai  
Google Research  
Mountain View, CA, USA  
cjcai@google.com

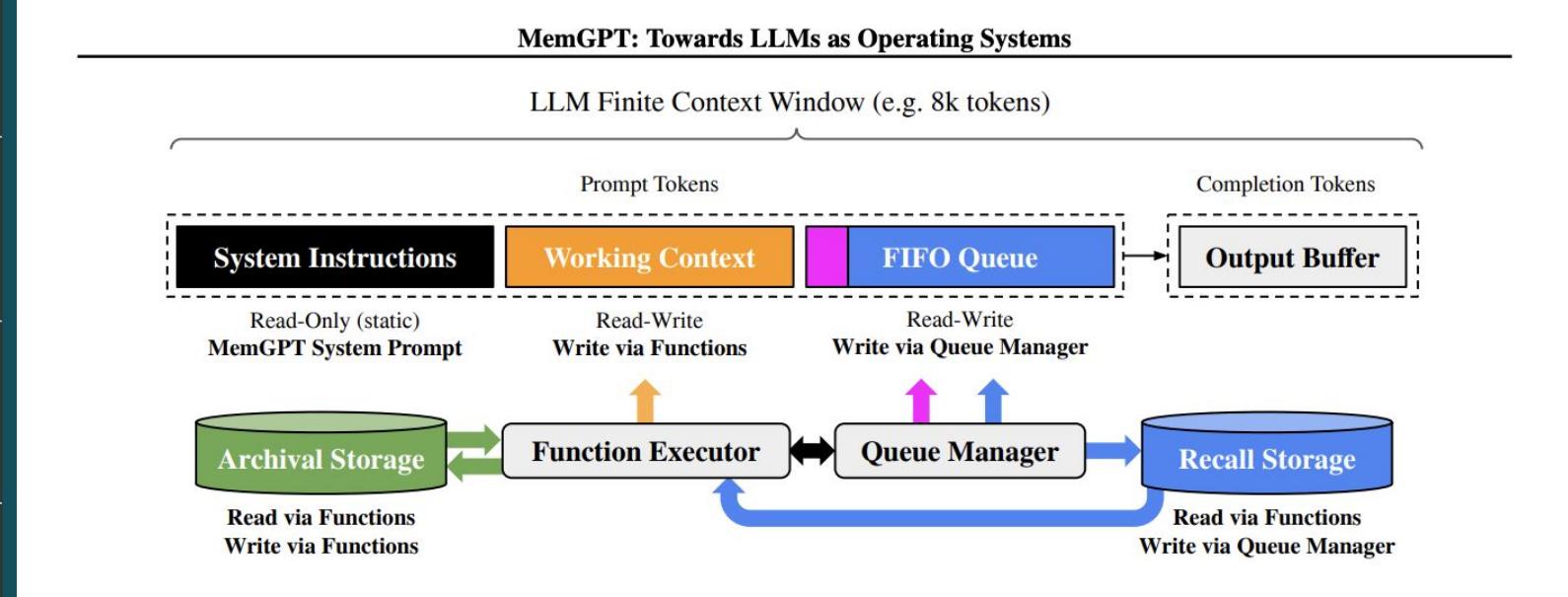
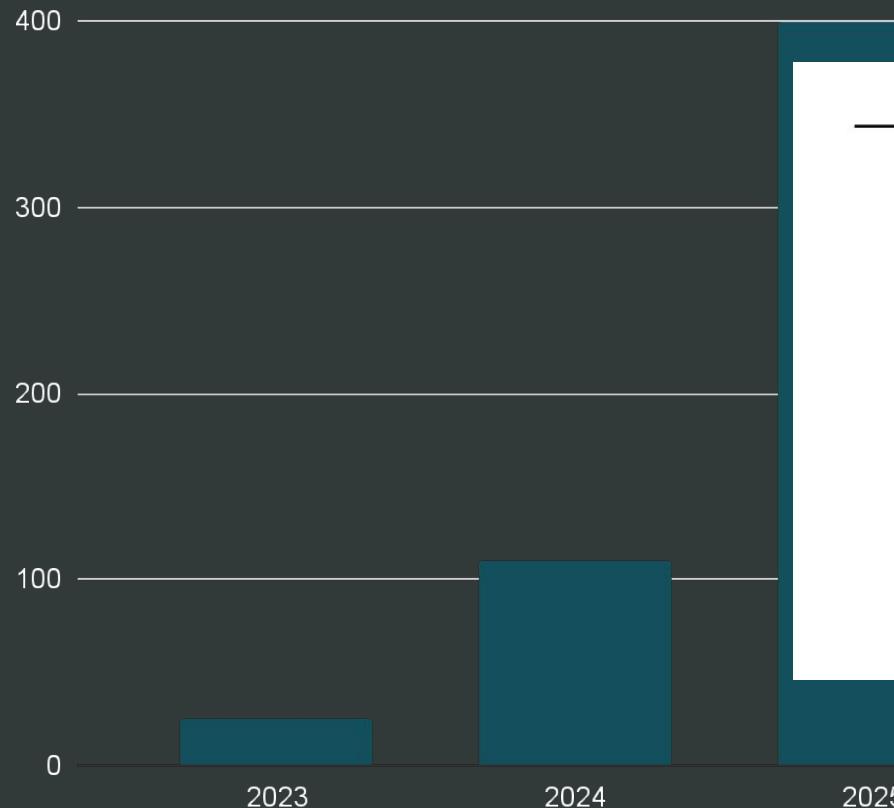
Michael S. Bernstein  
Stanford University  
Stanford, USA  
msb@cs.stanford.edu



Figure 1: Generative agents are believable simulacra of human behavior for interactive applications. In this work, we demonstrate generative agents by populating a sandbox environment, reminiscent of The Sims, with twenty-five agents. Users can observe and intervene as agents plan their days, share news, form relationships, and coordinate group activities.

Research Volume Signal

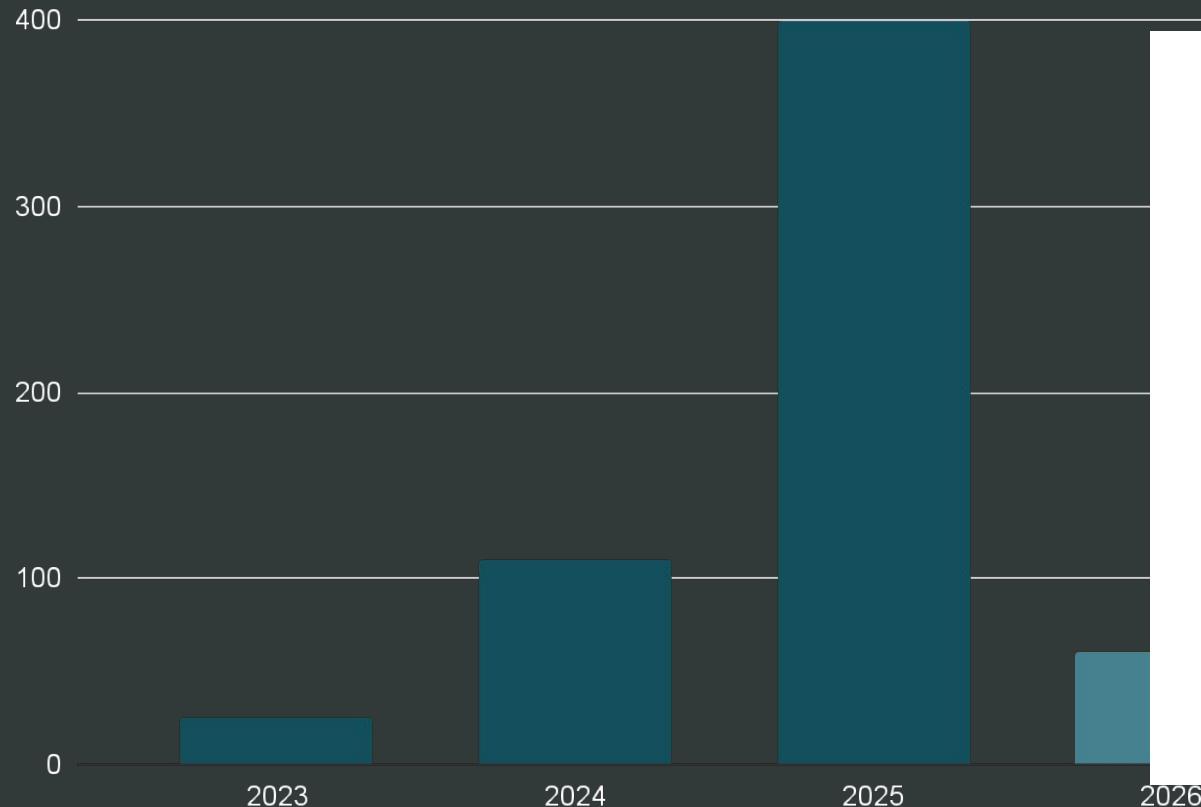
# Papers on Agent Memory Went From Niche to Critical



16x growth in 2 years

Research Volume Signal

# Papers on Agent Memory Went From Niche to Critical



16x growth in 2 years

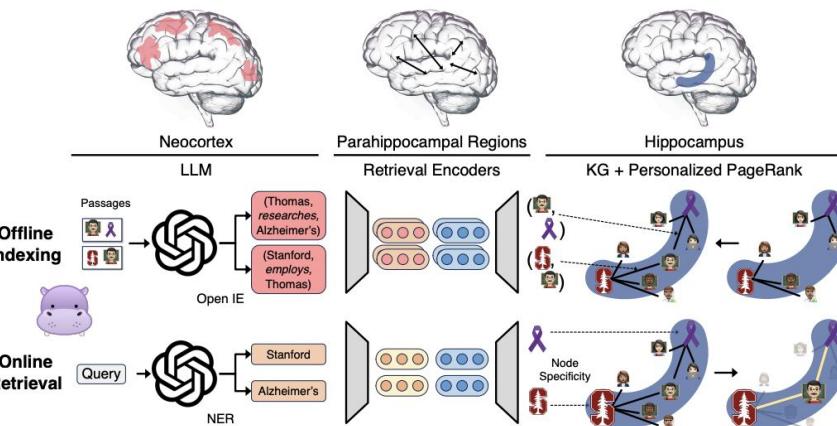
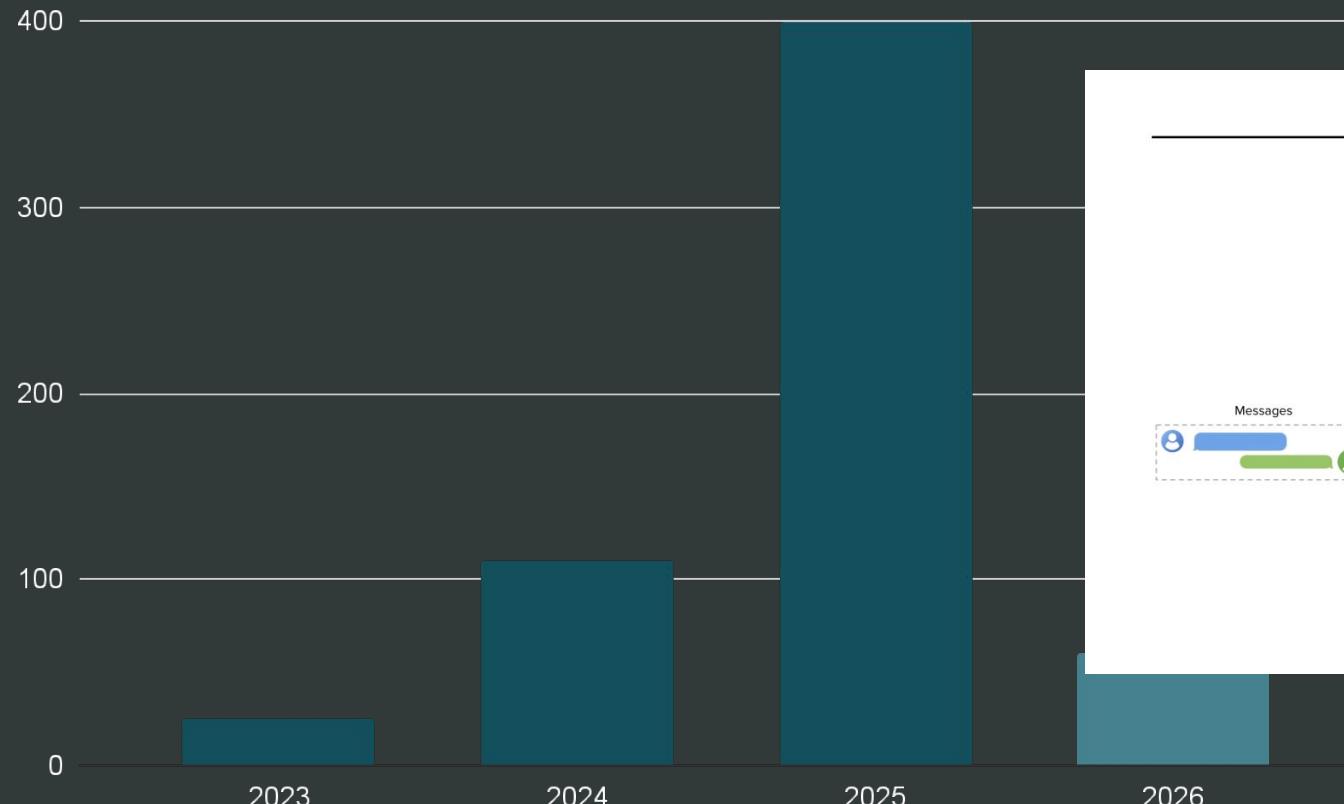


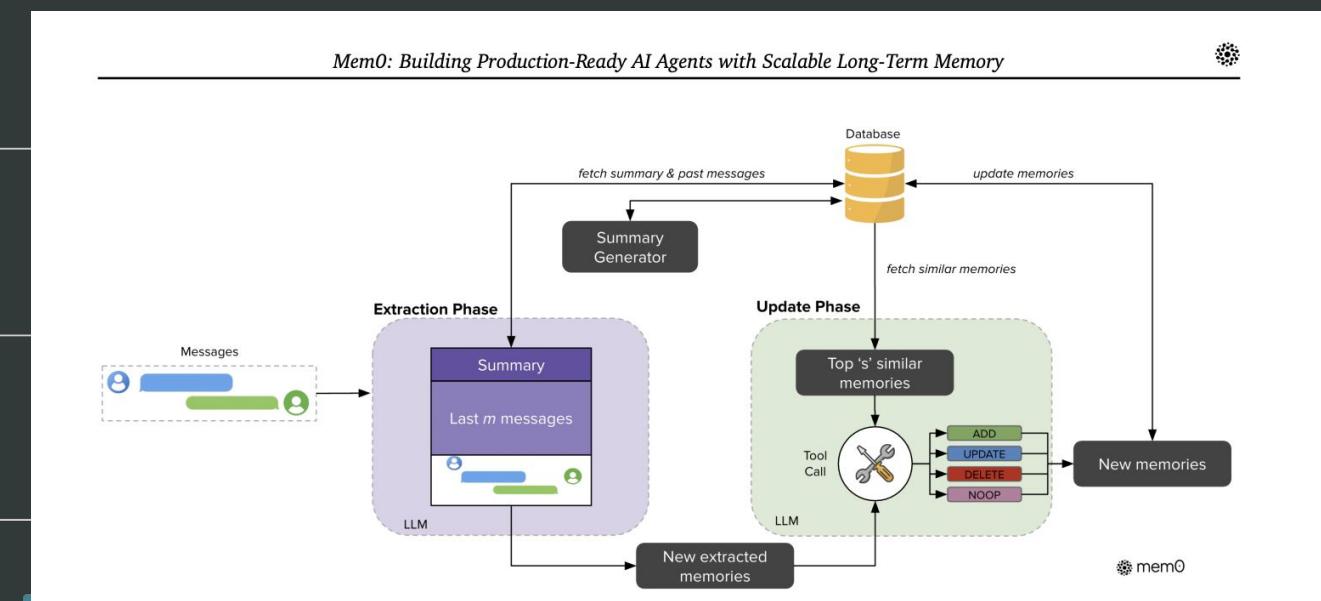
Figure 2: **Detailed HippoRAG Methodology.** We model the three components of human long-term memory to mimic its pattern separation and completion functions. For offline indexing (**Middle**), we use an LLM to process passages into open KG triples, which are then added to our artificial hippocampal index, while our synthetic parahippocampal regions (PHR) detect synonymy. In the example above, triples involving Professor Thomas are extracted and integrated into the KG. For online retrieval (**Bottom**), our LLM neocortex extracts named entities from a query while our parahippocampal retrieval encoders link them to our hippocampal index. We then leverage the Personalized PageRank algorithm to enable context-based retrieval and extract Professor Thomas.<sup>4</sup>

Research Volume Signal

# Papers on Agent Memory Went From Niche to Critical

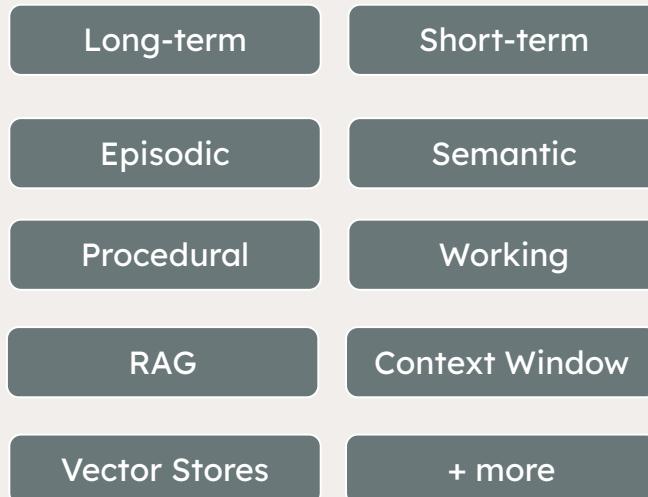


16x growth in 2 years

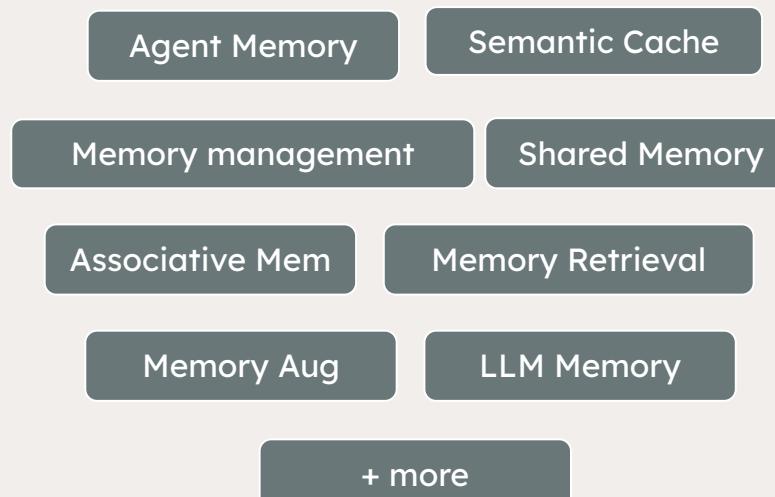


# Keywords and Terminology Growth

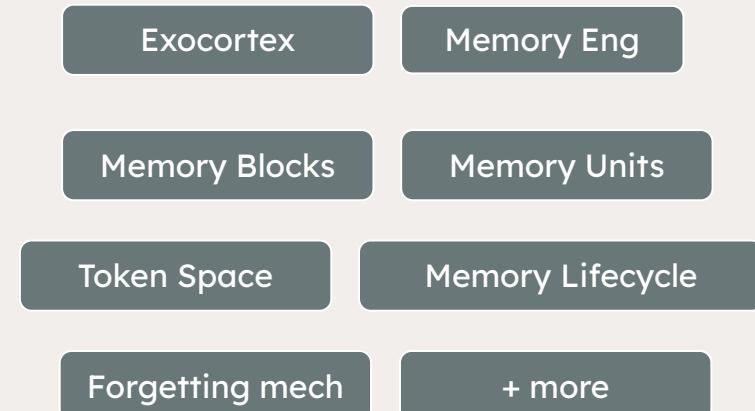
2023



2024



2025



## OPEN SOURCE SIGNAL

# The community has voted with stars.

## Mem0

Universal memory layer

**29K+**

GitHub stars · May 2025

## Letta

Formerly MemGPT · UC Berkeley

**16K+**

GitHub stars · May 2025

## The Ecosystem

Dedicated memory projects in 2025

**20+**

Active OSS repos · growing weekly

INCLUDES ·

Zep

LangMem

MemoS

OpenMemory

Graphiti

Memory

Cognee

Second Me

In 2023 there were 2–3 memory libraries.

In 2025 there are 20+ dedicated projects.

In 2 years.

## INFRASTRUCTURE SIGNAL

# Memory is no longer a feature. It's a layer.

## FRAMEWORKS SHIPPING MEMORY NATIVELY

**LangChain**

Shipped LangMem as native LangGraph component

**CrewAI**

Integrated Mem0 natively for persistent user memory

**Microsoft AutoGen**

Uses Mem0 as a first-class memory provider

**MCP (Model Context Protocol)**

Memory tools now ship as MCP servers by default

## THE BOLDEST SIGNAL

**Memory OS**

The community isn't just building  
memory *libraries*.

**They're building an operating  
system for memory.**

v2.0 (Dec 2025):

- Multi-modal memory · Tool memory
- MCP integration · Lifecycle management
- Persistent storage · Memory consolidation

## INDUSTRY SIGNAL 01 / 02

### PLATFORM SIGNAL

# Every major AI platform shipped memory in 12 months.

**OpenAI**  
ChatGPT Memory  
**Sep 2024**  
All tiers · saved + chat history

**Microsoft**  
Copilot Memory  
**2025**  
Persistent memory across M365

**Google**  
Vertex AI Memory Bank  
**Jul 2025**  
Agent-native · Gemini powered extraction

**Anthropic**  
Claude 4 Memory Files  
**2025**  
Opus 4: "skilled at maintaining memory files"

**xAI**  
Grok Memory  
**2025**  
Cross-session persistent context

### MARKET SCALE

**\$3.8B**  
Raised by AI agent startups in 2024

**\$13B**  
Enterprise AI agent ARR by end 2025

**42%**  
Agent startups at commercial scale

"Without memory, agents treat each interaction as the first, asking repetitive questions and failing to recall preferences."  
— Google Vertex AI Documentation, 2025

VALIDATION SIGNAL

# Memory is the make-or-break variable.

MIT NANDA · THE GENAI DIVIDE · JULY 2025

**95%**

of \$30–40B in enterprise AI investment  
delivers zero measurable P&L impact

THE ROOT CAUSE, PER MIT:

**"Most GenAI systems do not retain  
feedback, adapt to context, or improve."**

63% of executives demand context retention  
66% want systems that learn from feedback  
based on 300+ initiative reviews, 52 interviews, 153 senior leaders

PALO ALTO NETWORKS · MOLTBOT REPORT · JAN 2026

Moltbot: 85K GitHub stars in 1 week  
viral because of one capability:  
**Persistent Memory**

PALO ALTO ANALYSIS:

"Moltbot succeeded by solving what users  
cited as the #1 friction point in AI: having  
to re-explain context **every single time.**"

The most starred agent project in GitHub history  
Memory was the differentiator

Prompt Engineering

Context Engineering

Memory Engineering ?



# Memory Engineering

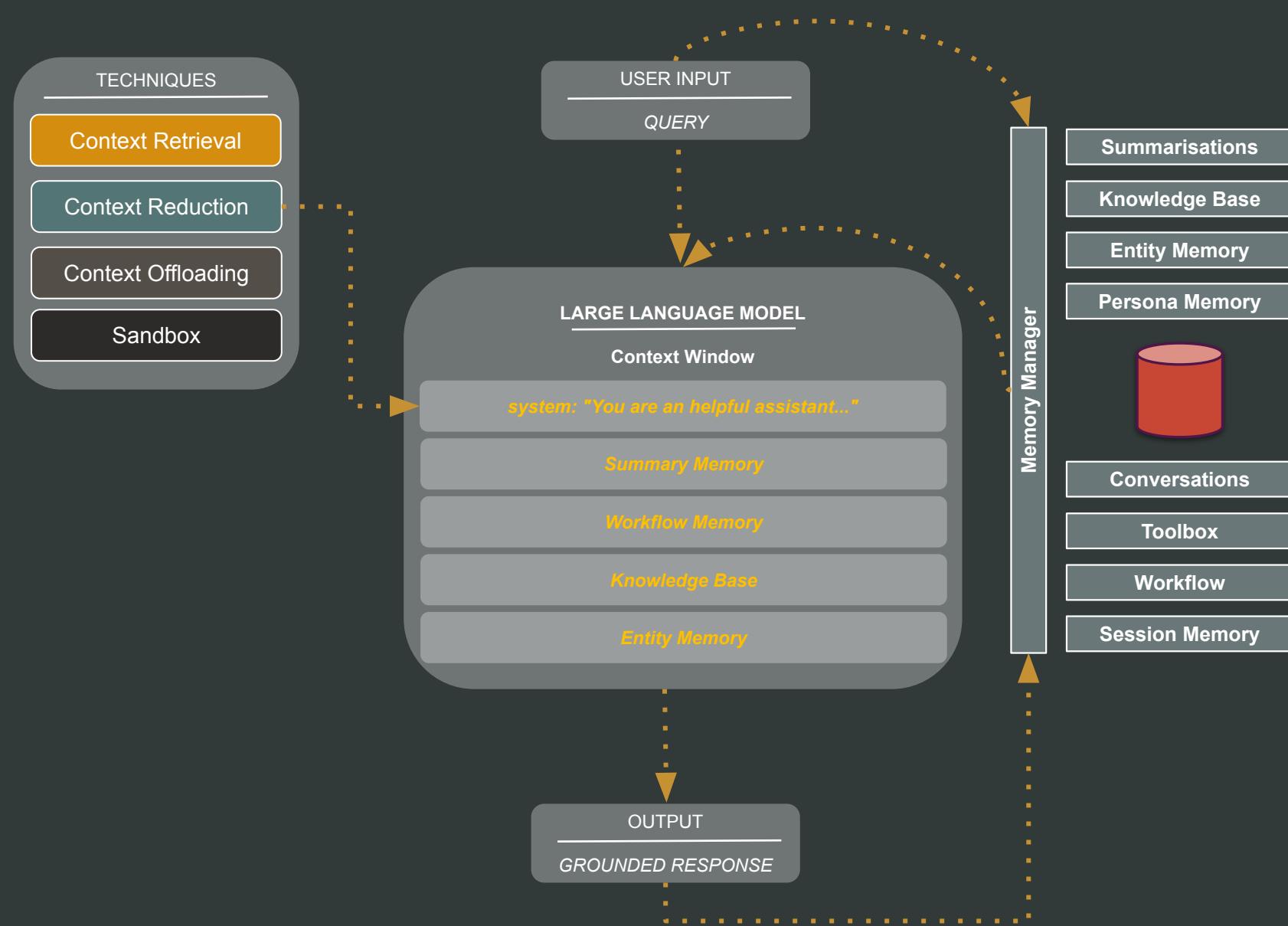
---

The discipline of creating systems that systematically process, store, retrieve, and update information; transforming raw data into persistent memory components, then dynamically assembling the most relevant of those components to populate an LLM's context window for each interaction, session, or operational round.

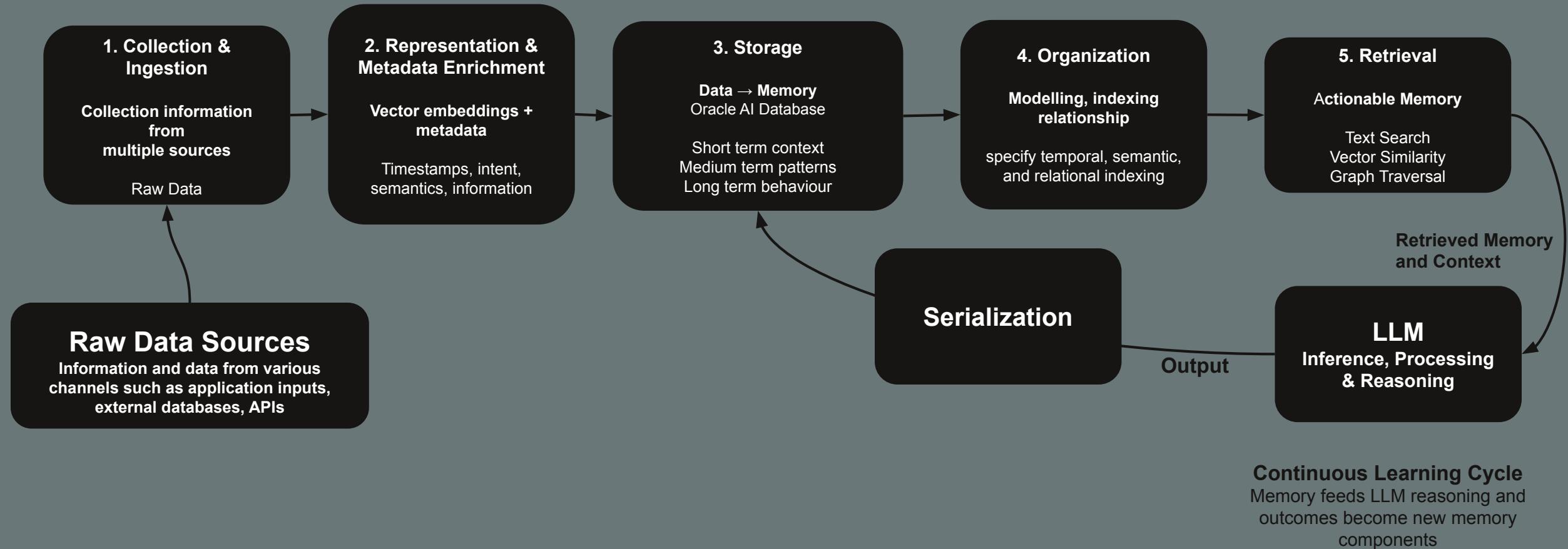
The goal is to build AI agents that don't just respond intelligently in the moment, but continuously adapt to new information, growing more reliable, believable, and capable over time.

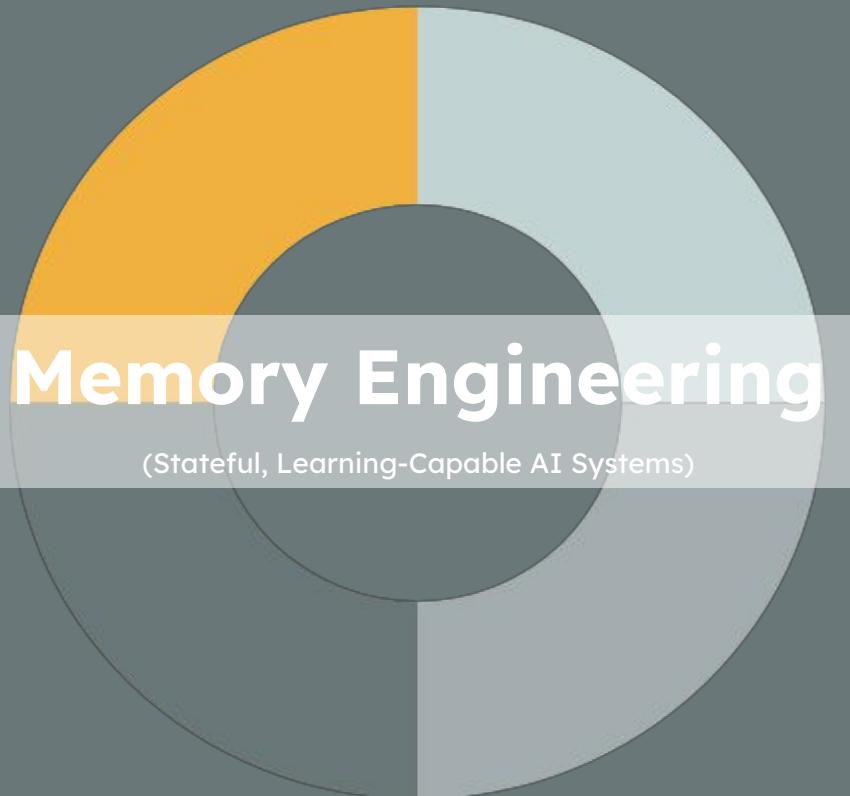
# Memory Engineering

The engineering discipline focused on designing, building, and maintaining memory systems for AI agents. It encompasses the storage, retrieval, classification, and lifecycle management of agent memory.



# AI Memory Lifecycle





## Database Engineering

Persistent Storage  
Typed Schemas  
ACID Transactions  
Multi-Store Architecture  
Versioning & Backup

## Information Retrieval

Hybrid Search  
Vector Indexes (HNSW, IVF)  
Relevance Ranking  
Context Assembly  
Query Optimization

## Agent Engineering

Memory Lifecycle  
Write-Back Loops  
Memory Extraction  
Autonomous Consolidation  
Context-Aware Routing

## Machine Learning Engineering

Embedding Models  
Fine-Tuning (SLMs)  
Model Versioning  
Reranking Pipelines  
Continual Learning

## Database Engineering

Provides the persistent storage layer for agent memory systems. Manages typed memory schemas (episodic, semantic, procedural, associative), ensuring ACID transactions for memory writes and consistent state across multi-store architectures. Handles backup, versioning, and recovery strategies to maintain memory integrity over time. Designs sharding, replication, and caching strategies that enable memory systems to scale across distributed environments while maintaining performance and reliability.

## Agent Engineering

Defines the memory lifecycle: creation, consolidation, decay, and retrieval. Designs write-back loops that extract learnings from agent outputs, classify memory types, and route updates to appropriate stores. Enables autonomous memory maintenance where agents self-manage their own knowledge without manual intervention.

# Memory Engineering

(Stateful, Learning-Capable AI Systems)

## Information Retrieval

Optimizes how memories are found and ranked through hybrid search strategies combining dense vector similarity with sparse keyword matching. Tunes index selection (HNSW, IVF) and approximate nearest neighbor algorithms to balance retrieval speed with accuracy. Ranks results by relevance, recency, and importance, then assembles context from multiple stores to fit within LLM token limits while preserving critical information. Manages the full retrieval pipeline from query to context delivery.

## Machine Learning Engineering

Fine-tunes embedding models and small language models for domain-specific memory needs, optimizing semantic representations for enterprise contexts. Manages model versioning, deployment pipelines, and performance monitoring across the memory stack. As the system matures, ML Engineering becomes the arbiter of model selection, determining when to use foundation models versus fine-tuned variants, and balancing accuracy, latency, and cost across the entire memory architecture.

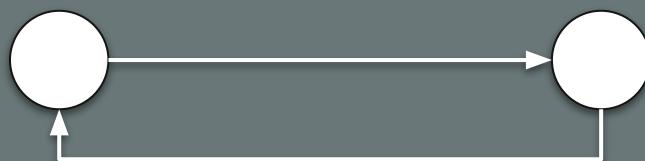


# Common Application Modes in AI Agents

## Assistant

Conversational, reactive, relationship-driven agents.

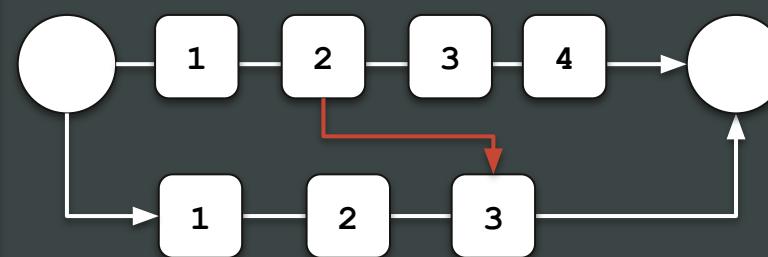
Assistant agents typically operate in an interactive, turn-by-turn conversation loop, responding to user instructions, maintaining short-term context, and retrieving long-term preferences or past interactions when needed.



## Workflow

Multi-step, goal-oriented, stateful process execution.

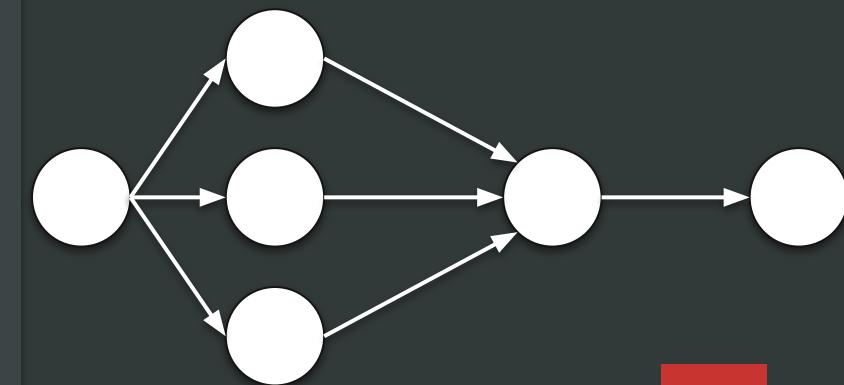
Workflow Mode agents follow structured, multi-step procedures, often involving tool use, planning, and state tracking. They act like autonomous workers executing a task from start to finish.



## Deep Research

Long-horizon reasoning, synthesis, and multi-source investigation.

Agents perform extended, multi-turn investigations, pulling information from diverse sources, iterating, reflecting, and consolidating knowledge across time.

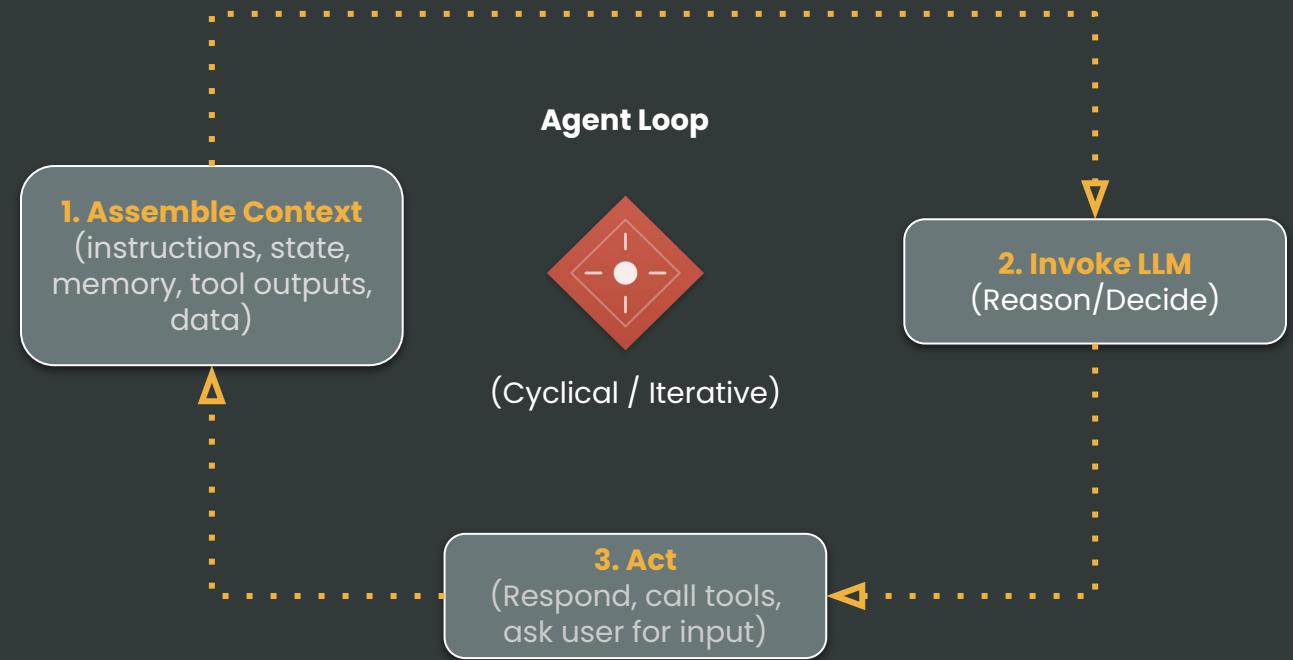


# Agent Loop

A cyclical, iterative execution pattern inside a single agent run/turn where an agent repeatedly:

1. **assembles** context (instructions, conversation state, retrieved memory, tool outputs, relevant data),
2. **invokes** an LLM to reason/decide, and then
3. **acts** (responds, calls tools, writes memory/state, or updates the plan),

until a stop condition is met, e.g., a final answer is produced, a goal is completed, an error/timeout occurs, or the agent explicitly decides to exit.

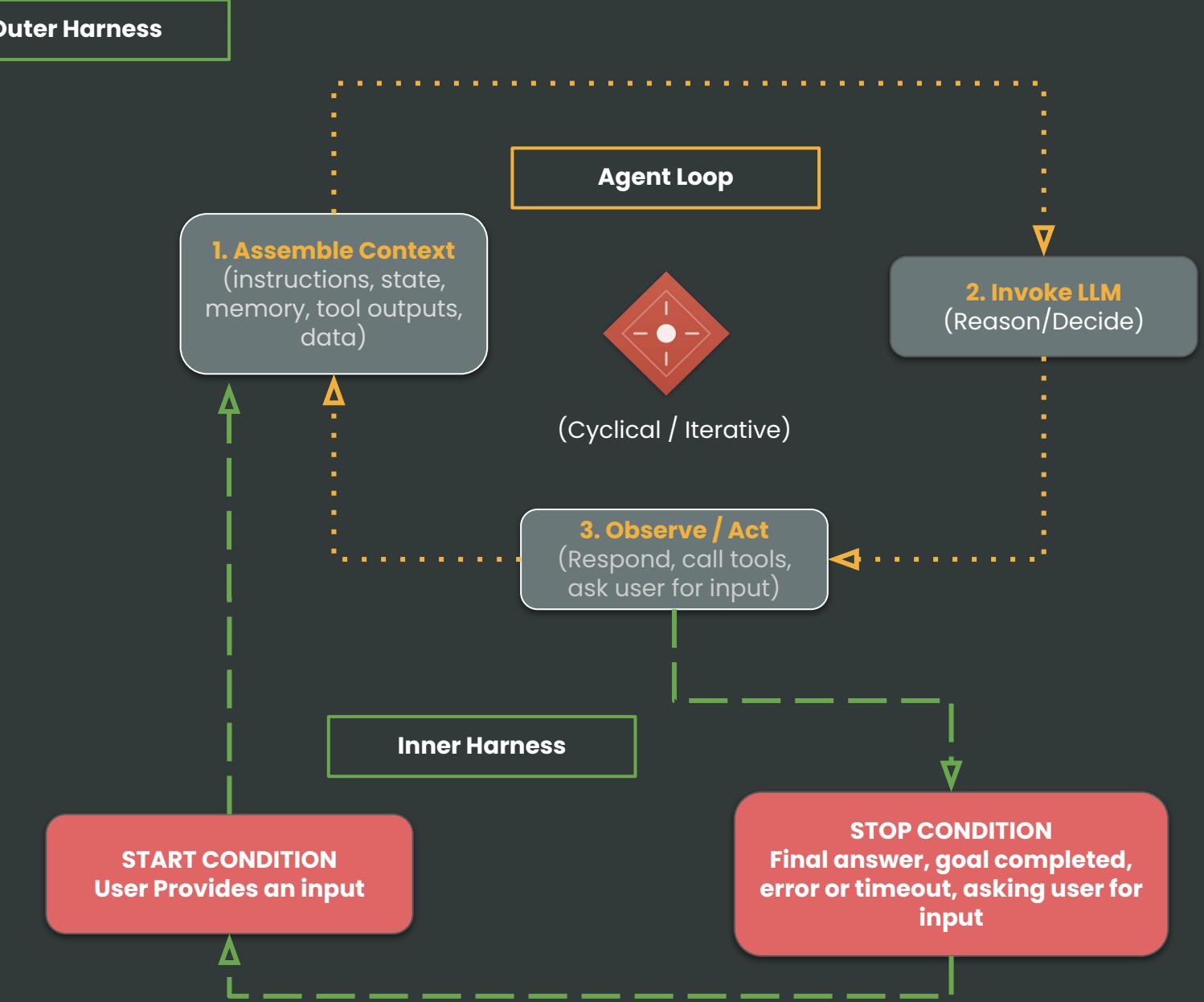


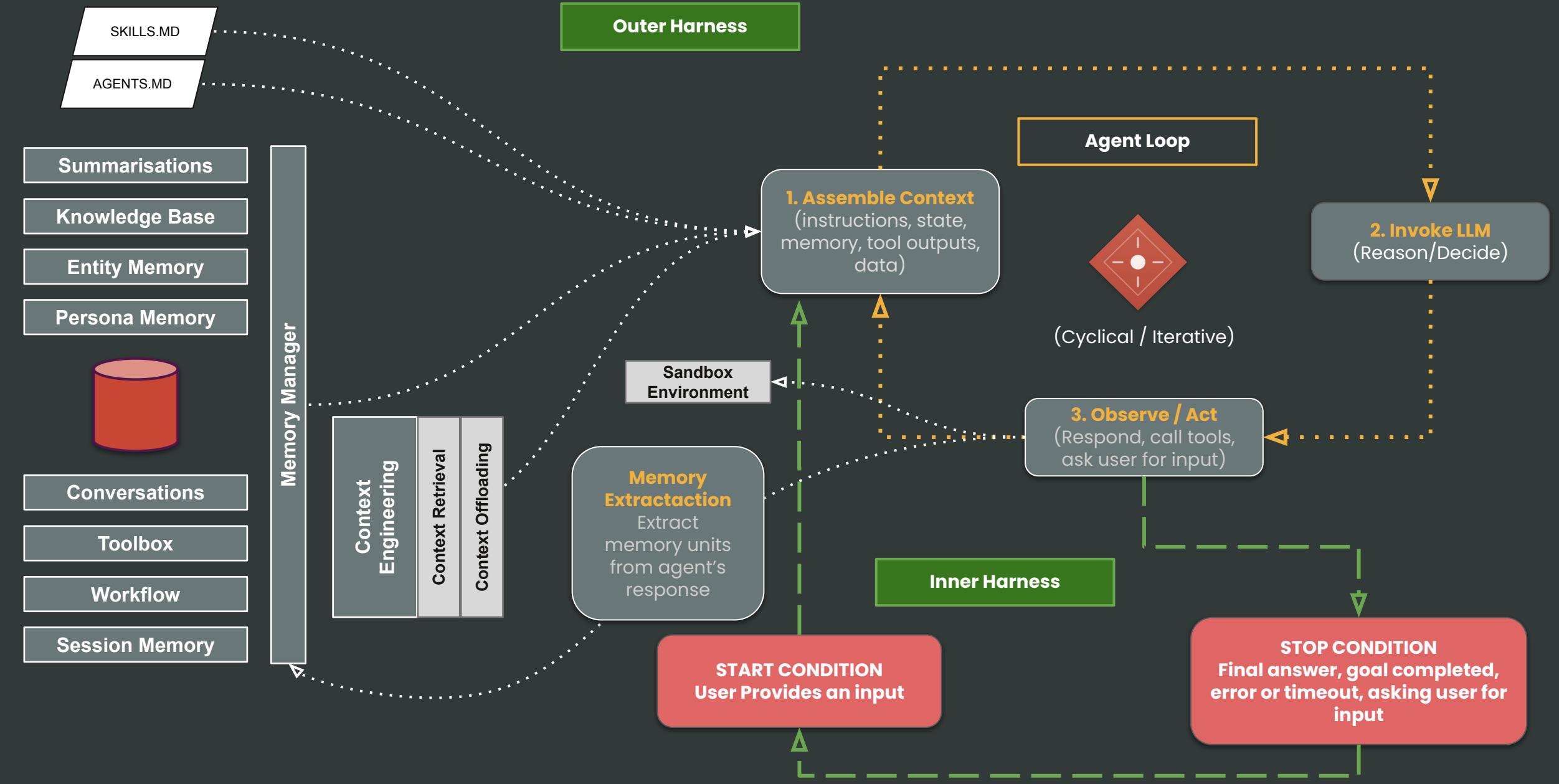
# Agent Harness and MemOps

The infrastructure and scaffolding surrounding an LLM-enabled agent designed to ensure reliable, desirable outcomes.

Components include memory operations, control systems, environment information, coding principles, and task-specific tooling.

**Memory operations are particularly critical, enabling agents to adapt reliably and extend their capabilities over time.**

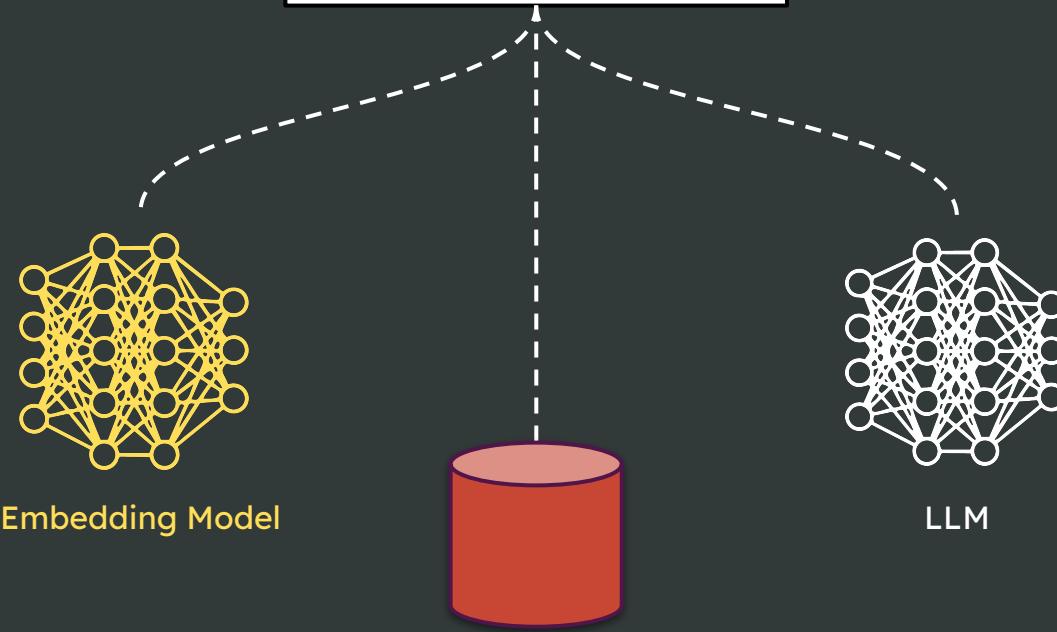




## Agent Memory Core

The primary data infrastructure component of an agent system, responsible for managing the complete lifecycle of agent memory. This database layer handles persistent storage, efficient retrieval, and memory operations that enable agents to adapt to new information, learn from interactions, and maintain consistent performance across sessions.

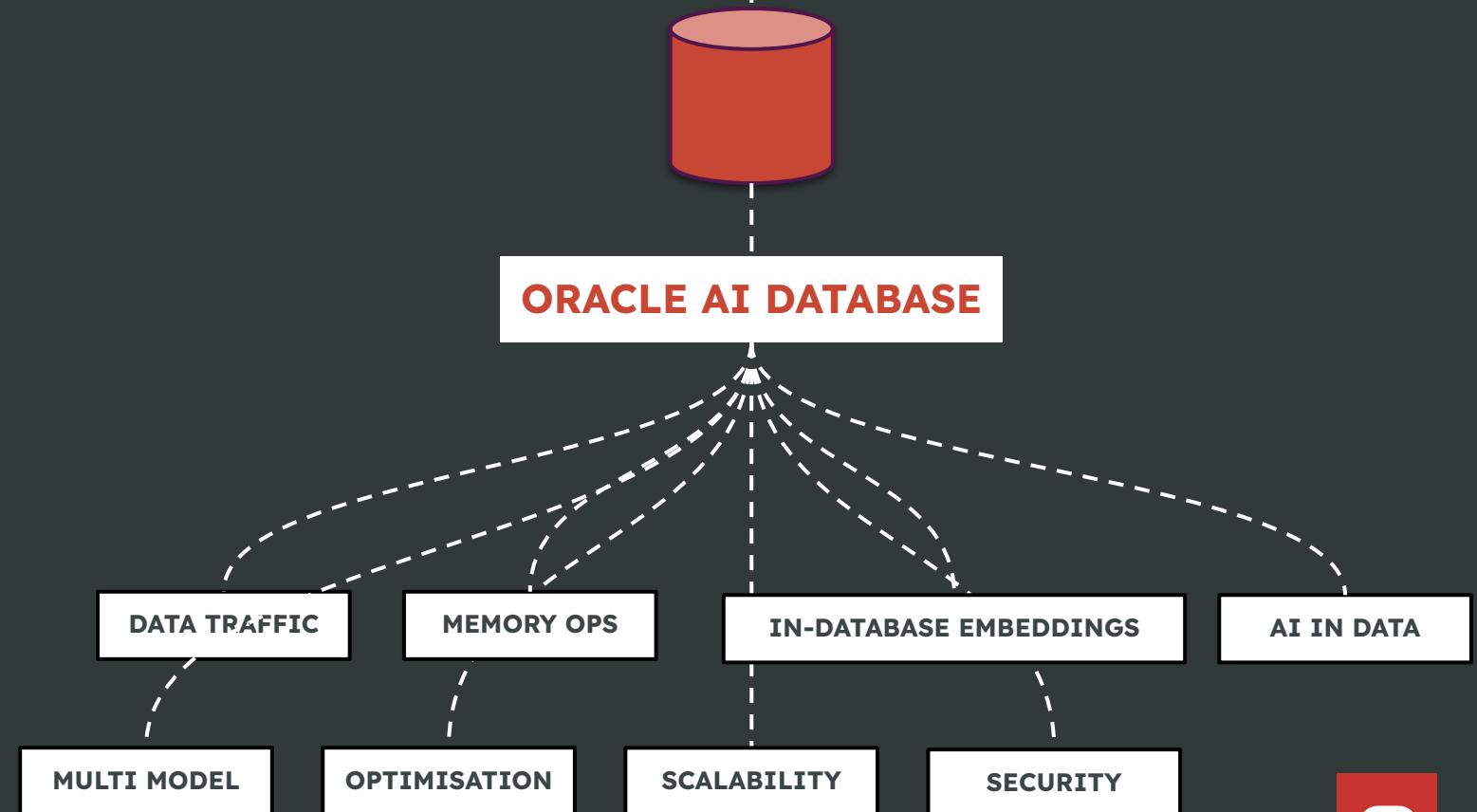
## Agent Memory



## Agent Memory Core

The primary data infrastructure component of an agent system, responsible for managing the complete lifecycle of agent memory. This database layer handles persistent storage, efficient retrieval, and memory operations that enable agents to adapt to new information, learn from interactions, and maintain consistent performance across sessions.

## Agent Memory Core



***Database technology will be  
at the very center***

at the very center

**Insert Target Here** is DEAD

Insert Target Here

SaaS

is DEAD

saaS

O

RAG

is DEAD

SWE

is DEAD

2ME

O

**IDE**

**is DEAD**

**TDF**

**O**

***the internet is not going to  
end the database market. It  
will drastically expand it.***

it will drastically expand it.  
It will drastically expand it.

# The Agent Stack

<b>Application</b>	Applications, UIs, and enterprise systems that embed, trigger, or consume agent outputs. This is where users or automated systems initiate agent tasks.
<b>Gateway and Connectivity</b>	Communication pathways, APIs, chat channels, connectors, and distributed messaging. Handles external calls into the agent and internal asynchronous communication between services/agents.
<b>Orchestration</b>	The agent's control logic: planning, routing, decomposing tasks, enforcing policies, and managing the plan → act → observe loop.
<b>Reasoning</b>	The cognitive engine. Performs LLM reasoning, interpretation, tool-call generation, synthesis, and context understanding.
<b>Memory Managers</b>	Responsible for embedding generation, query vectorisation, reranking, memory-type selection, summarisation, consolidation, and deciding what and how the agent retrieves before filling Working Memory.
<b>Tooling</b>	The agent's action execution system. Tools/APIs the agent can call to perform real operations: queries, integrations, scripts, functions, pipelines.
<b>Governance and Reliability</b>	Ensures safe, observable, compliant, and reliable agent behaviour: guardrails, IAM, logging, monitoring, auditing, anomaly detection.
<b>Memory Core</b>	Durable memory storage + the engine that executes vector search, JSON retrieval, relational and graph queries, and hybrid search.
<b>Infrastructure</b>	Runtime foundation for agents: compute, containers, networking, scaling, observability, service mesh. Ensures operational reliability.

# The Agent Stack

<b>Application</b>	Oracle APEX, Oracle Fusion Apps
<b>Gateway and Connectivity</b>	API Gateway, Integration Cloud, Digital Assistants, Oracle Streaming Service, Service Bus, OCI Notifications, Open Agent Specification
<b>Orchestration</b>	OCI Generative AI Agents, Wayflow, OCI Functions, AgentSpec
<b>Reasoning</b>	OCI Generative AI (LLMs), OCI Data Science Model Deployment
<b>Memory Managers</b>	OCI Language Models and Embeddings Models, Oracle AI Integration Ecosystem
<b>Tooling</b>	Oracle Integration Cloud, OCI Functions
<b>Governance and Reliability</b>	Cloud Guard, OCI IAM, OCI Logging, OCI Monitoring, OCI Audit, Data Safe
<b>Memory Core</b>	Oracle AI Database, Autonomous Database, FreeSQL, Oracle Feature Store
<b>Infrastructure</b>	OCI Compute, OKE, OCI Functions, Load Balancer, Oracle Data Science

Our mission is to help people see  
data in new ways, discover insights,  
unlock endless possibilities.



# JOURNEY

---