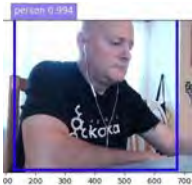


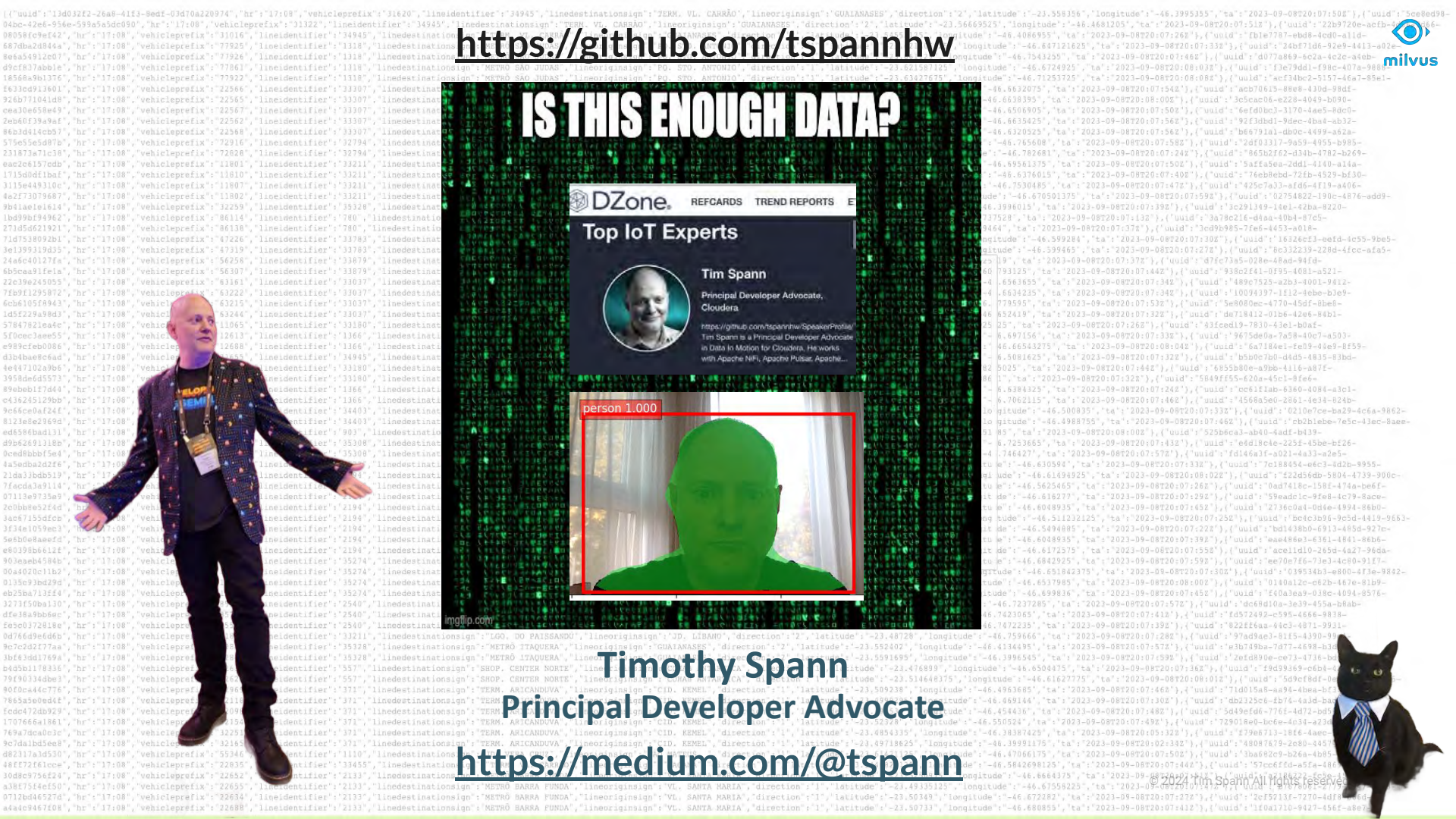
# Enriching Generative AI as Events in Real-Time Streaming Pipelines

Tim Spann  
Principal Developer Advocate

May 2024



**CONF42**  
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<https://github.com/tspannhw>

# IS THIS ENOUGH DATA?

**DZone** REFCARDS TREND REPORTS E

## Top IoT Experts

**Tim Spann**  
Principal Developer Advocate, Cloudara

<https://github.com/tspannhw/SpeakerProfile>  
Tim Spann is a Principal Developer Advocate in Data In Motion for Cloudara. He works with Apache Nifi, Apache Spark, Apache...

person 1.000

imgflip.com

## Timothy Spann Principal Developer Advocate

<https://medium.com/@tspann>



# FLaNK-AIM Stack Weekly



**towhee**

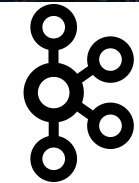
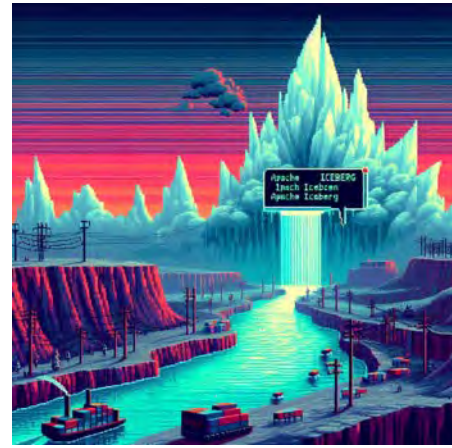


<https://bit.ly/32dAJft>

<https://www.meetup.com/futureofdata-princeton/>

**This week in Milvus, Towhee, Attu, Apache NiFi, Apache Flink, Apache Kafka, ML, AI, Apache Spark, Apache Iceberg, Python, Java, LLM, GenAI, Vector DB and Open Source friends.**





**towhee**

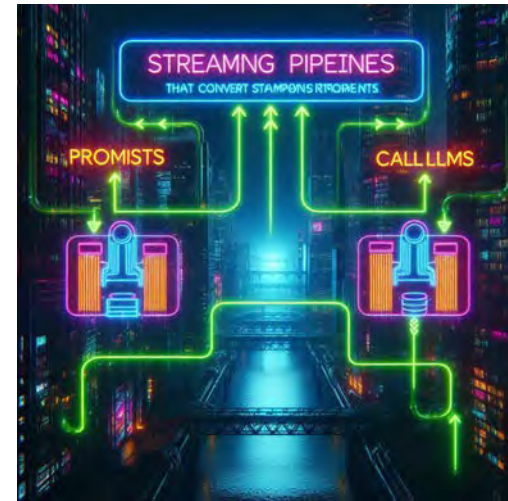
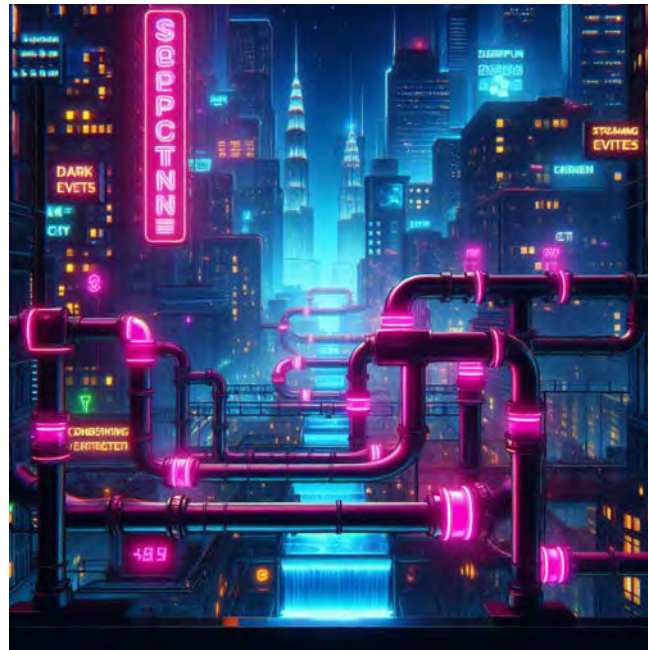


**Milvus**





# Let's build streaming pipelines that convert streaming events into prompts and call LLMs and process the results.



# Unstructured Data is Everywhere

Unstructured data is any data that does not conform to a predefined data model.

By 2025, IDC estimates there will be 175 zettabytes of data globally (that's 175 with 21 zeros), with **80% of that data being unstructured.**



Text



Images



Video



and more!

# BEFORE MILVUS

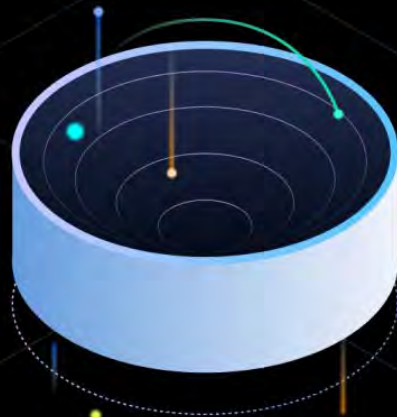






OLFAI  
& DATA

Vector database built for scalable  
similarity search



1gflip.com

JANE CLARK TUMBUK



<https://milvus.io/milvus-demos/reverse-image-search/>

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### Easy Setup

Pip-install to start coding in a notebook within seconds.



### Reusable Code

Write once, and deploy with one line of code into the production environment



### Integration

Plug into OpenAI, Langchain, LlmIndex, and many more



### Feature-rich

Dense & sparse embeddings, filtering, reranking and beyond



**Milvus** is an **open-source vector database** for **GenAI** projects. Pip-install on your laptop, plug into popular AI dev tools, and push to production with a single line of code.



**27K+**

GitHub Stars



**2,600+**

Forks



**25M+**

Downloads



**250+**

Contributors

# We've built technologies for various types of use cases



## Index Types

Offer a wide range of **15 indexes** support, including popular ones like HNSW, PQ, Binary, Sparse, DiskANN and GPU index

Empower developers with tailored search optimizations, catering to performance, accuracy and cost needs



## Search Types

Support multiple types such as **top-K ANN, Range ANN, sparse & dense, multi-vector, grouping**, and metadata **filtering**

Enable query flexibility and accuracy, allowing developers to tailor their information retrieval needs



## Multi-tenancy

Enable **multi-tenancy** through collection and partition management

Allow for efficient resource utilization and customizable data segregation, ensuring secure and isolated data handling for each tenant

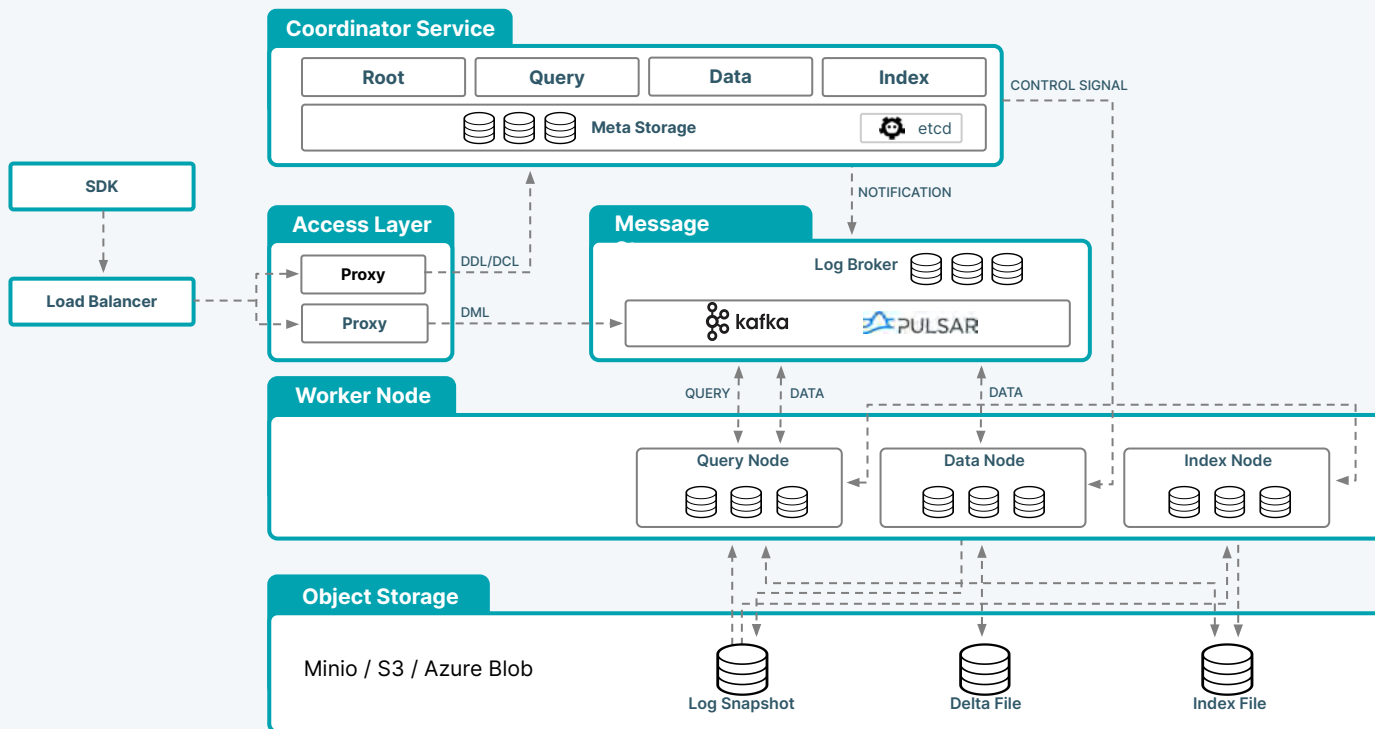


## Compute Types

Designed for various compute powers, such as **AVX512, Neon for SIMD, quantization cache-aware optimization** and **GPU**

Leverage strengths of each hardware type, ensuring high-speed processing and cost-effective scalability for different application needs

# Milvus' fully distributed architecture is designed scalability and performance





# Common AI Use Cases



## LLM Augmented Retrieval

Expand LLMs' knowledge by incorporating external data sources into LLMs and your AI applications.



## Recommender System

Match user behavior or content features with other similar behaviors or features to make effective recommendations.



## Text/ Semantic Search

Search for semantically similar texts across vast amounts of natural language documents.



## Image Similarity Search

Identify and search for visually similar images or objects from a vast collection of image libraries.



## Video Similarity Search

Search for similar videos, scenes, or objects from extensive collections of video libraries.



## Audio Similarity Search

Find similar audios from massive amounts of audio data to perform tasks such as genre classification, or recognize speech.



## Molecular Similarity Search

Search for similar substructures, superstructures, and other structures for a specific molecule.



## Question Answering System

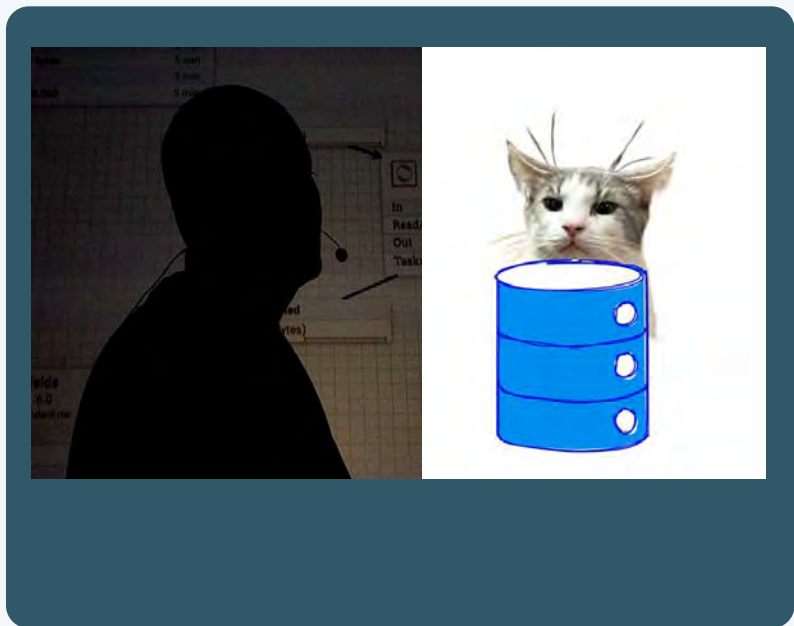
Interactive QA chatbot that automatically answers user questions



## Multimodal Similarity Search

Search over multiple types of data simultaneously, e.g. text and images

# Milvus Features



**Scalable and Elastic  
Architecture**

**Diverse Index  
Support**

**Versatile Search  
Capabilities**

**Tunable  
Consistency**



**Multi-Tenancy**

**Hardware-  
Accelerated  
Compute Support**

**Python, Java,  
Golang, NodeJS**

**Milvus Lite, K8,  
Zilliz Cloud, Docker**



# GEN AI







# DataFlow Pipelines Can Help

## External Context Ingest

Ingesting, routing, clean, enrich, transforming, parsing, chunking and vectorizing structured, unstructured, semistructured, binary data and documents

## Prompt engineering

Crafting and structuring queries to optimize LLM responses

## Context Retrieval

Enhancing LLM with external context such as Retrieval Augmented Generation (RAG)

## Roundtrip Interface

Act as a Discord, REST, Kafka, SQL, Slack bot to roundtrip discussions

# UNSTRUCTURED DATA WITH NIFI

- **Archives** - tar, gzipped, zipped, ...
- **Images** - PNG, JPG, GIF, BMP, ...
- **Documents** - HTML, Markdown, RSS, PDF, Doc, RTF, Plain Text, ...
- **Videos** - MP4, Clips, Mov, Youtube URL...
- **Sound** - MP3, ...
- **Social / Chat** - Slack, Discord, Twitter, REST, Email, ...
- **Identify Mime Types, Chunk Documents, Store to Vector Database**
- **Parse Documents** - HTML, Markdown, PDF, Word, Excel, Powerpoint





# NiFi 2.0.0 Features



- Python Integration
- Parameters
- JDK 21+
- JSON Flow Serialization
- Rules Engine for Development Assistance
- Run Process Group as Stateless
- `flow.json.gz`

<https://cwiki.apache.org/confluence/display/NIFI/NiFi+2.0+Release+Goals>

<https://medium.com/cloudera-inc/getting-ready-for-apache-nifi-2-0-5a5e6a67f450>

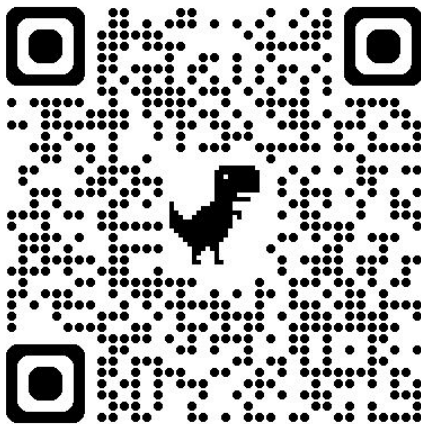




nifi

# Python Processors





# Address To Lat/Long

- Python 3.10+
- geopy Library
- Nominatim
- OpenStreetMaps (OSM)
- [openstreetmap.org/copyright](https://openstreetmap.org/copyright)
- Returns as attributes and JSON file
- Works with partial addresses
- Categorizes location
- Bounding Box



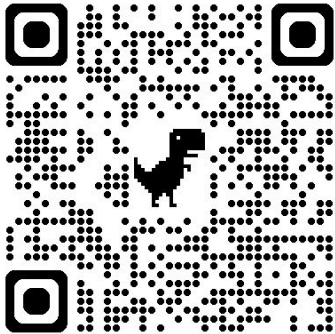


# DEMOS





# Building a Milvus Connector For NiFi



Medium

Read by



Write to

Read by



Write to



kafka

Consumed by

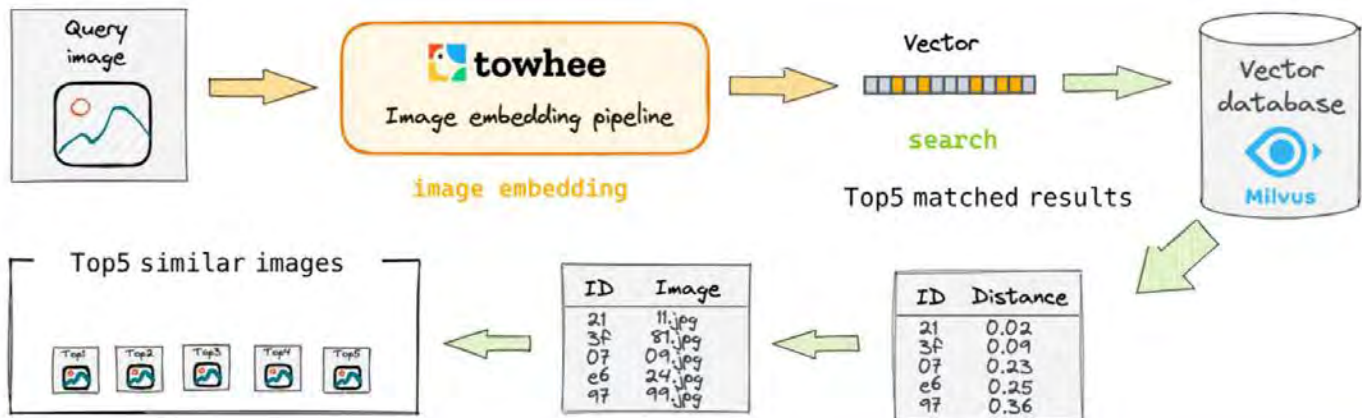
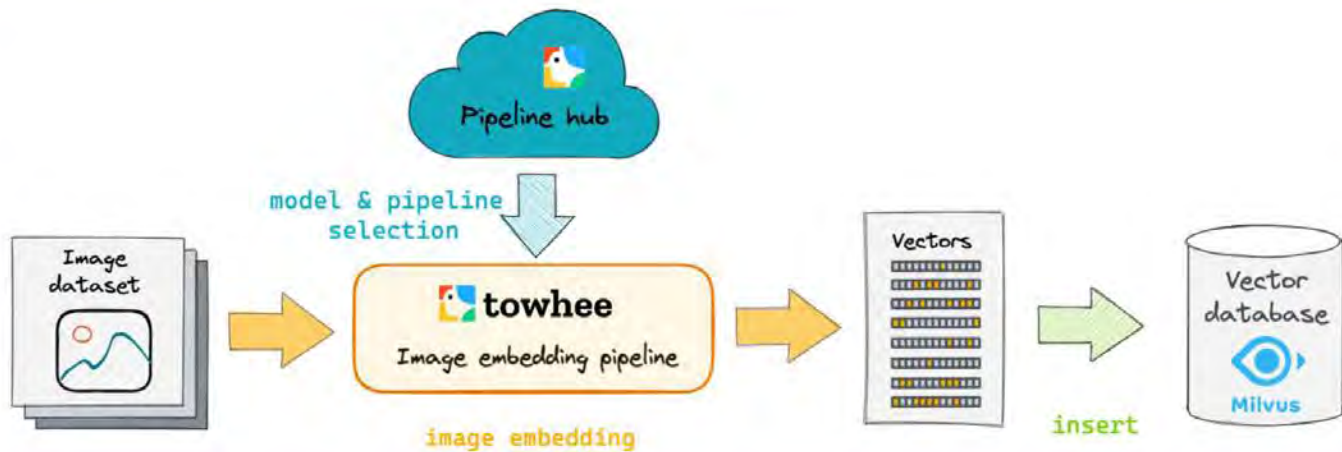


Flink

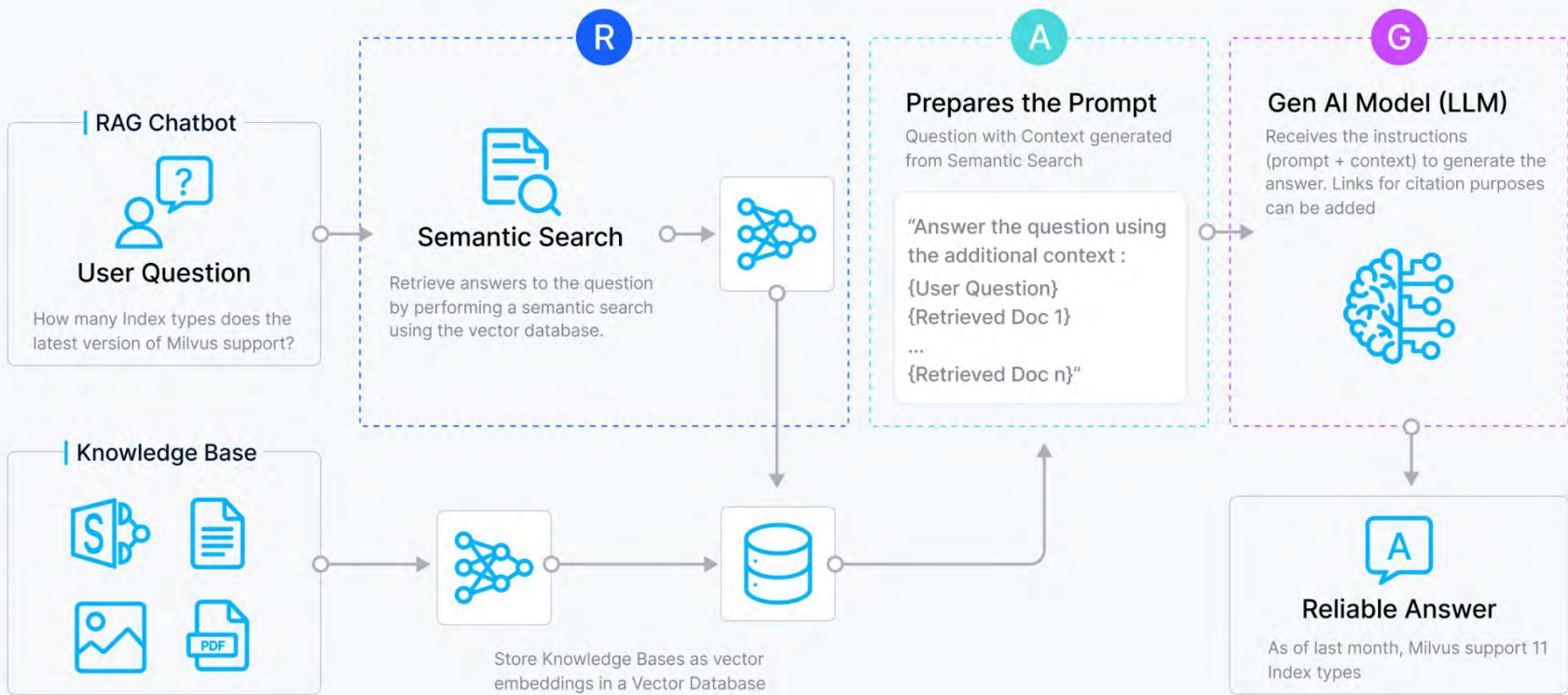
Write to



Milvus



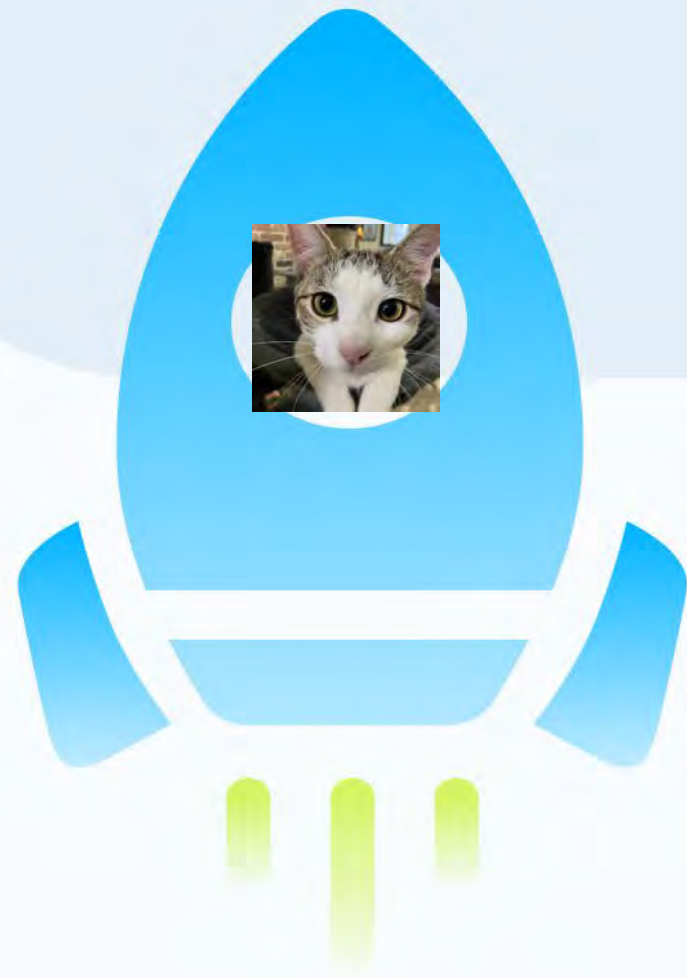
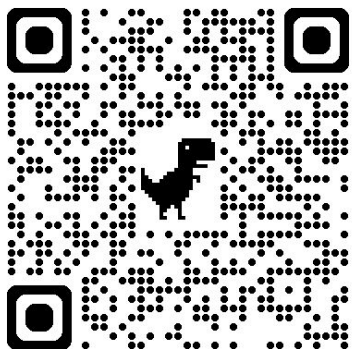
# Retrieval-Augmented Generation RAG Chatbot

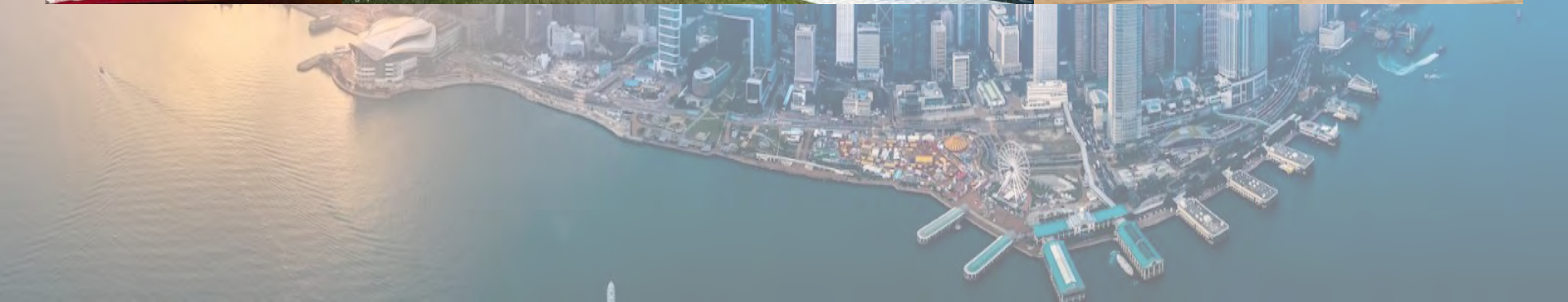


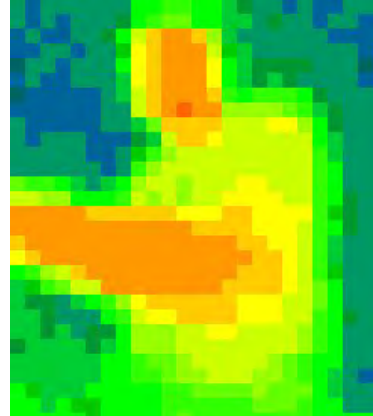




# How To Get Started With Milvus









# REAL-TIME EVENTS



# Why Use It?



Open Source

Fast

Many Indexes



# Why?



imgflip.com **TIME TO REBOOT THE CAT**

**LF AI & Data Foundation Graduate Project**

**Scalability and tunability to handle growing data volumes**

**Multi-tenancy and data isolation for efficient resource use and privacy**

**A comprehensive suite of APIs for diverse programming languages**

**User-friendly interfaces that simplify interaction with complex data.**