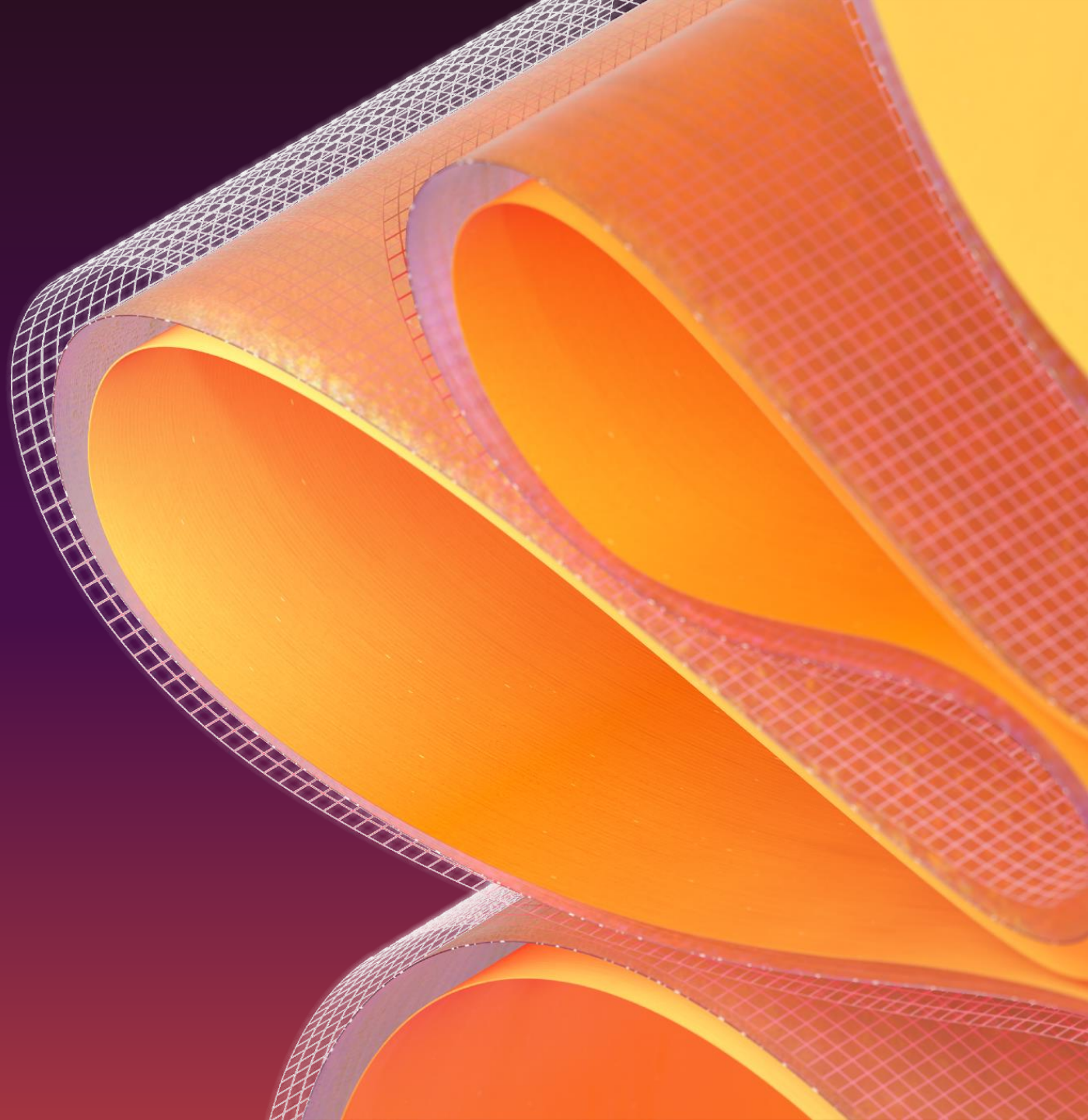




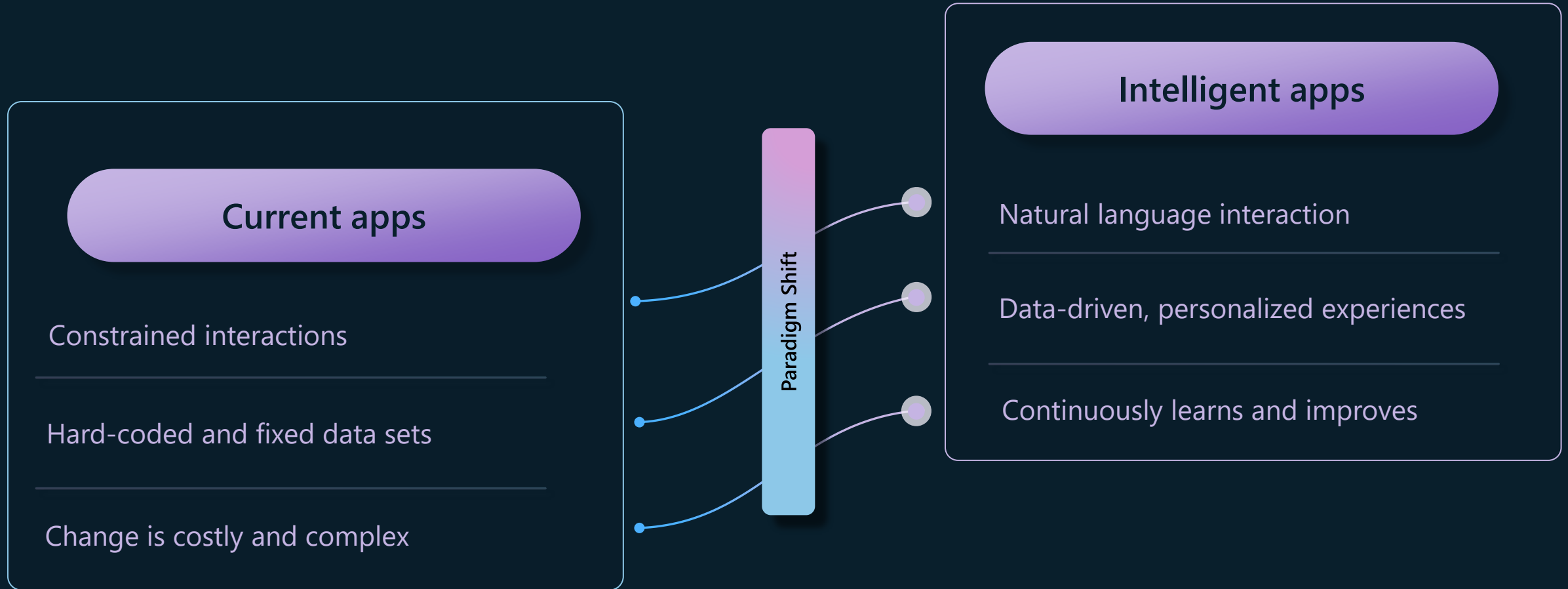
Build Your Own Copilot on Azure

Build and modernize intelligent apps on Azure

October 5, 2023



Generative AI makes apps truly intelligent



Essential elements of intelligent applications



Pre-trained models

State of the art pre-trained AI models that are easy to discover, customize, and integrate into new and existing enterprise applications.



Scalability and high performance

Ability to handle high volumes of unstructured data, in real time, from disparate sources

App platform that can scale based on the app's demand and ensure reliable performance.

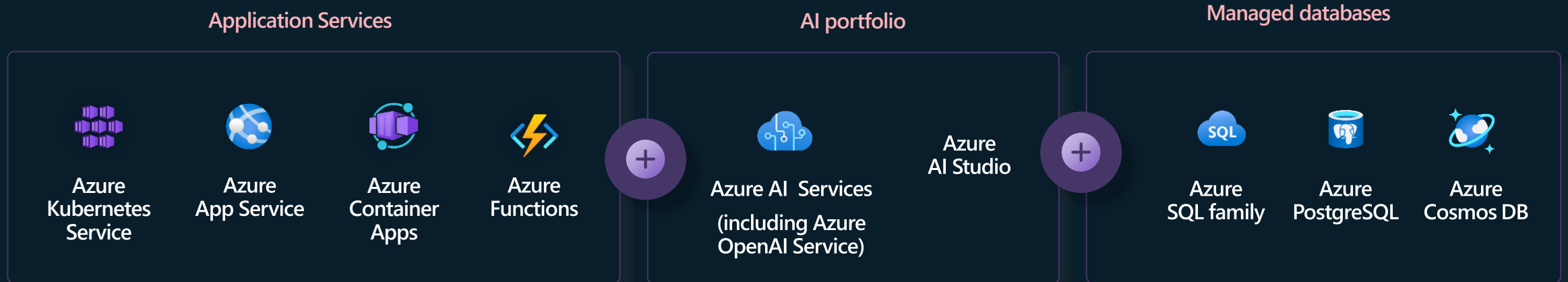


Simplified app delivery

Developer-ready environments to ship apps securely, and quickly in their language of choice.

Enable frequent iteration by streamlining costly and time-consuming app delivery.

A common platform with the technology you need



What is a copilot?

Copilots are intelligent apps that enable the use of natural language to find better and more relevant answers to questions.

Streamline the developer experience



Development: Faster, more productive,
and satisfying



OpenAI
Codex



Context

Suggestions

runtime.go course.rb time.js IsPrimeTest.java

```
1 package main
2
3 type Run struct {
4     Time int // in milliseconds
5     Results string
6     Failed bool
7 }
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
```



Visual Studio



Neovim

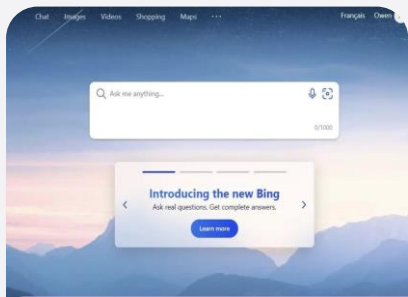


VS Code

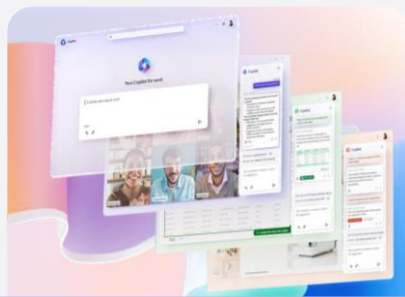


JetBrains IDEs

Microsoft copilots offer differentiation



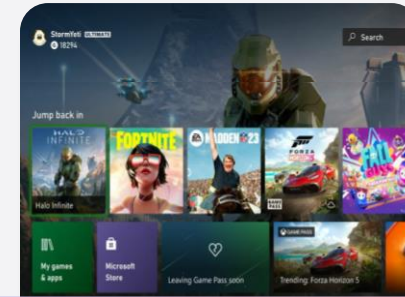
AI-based
search with
ChatGPT



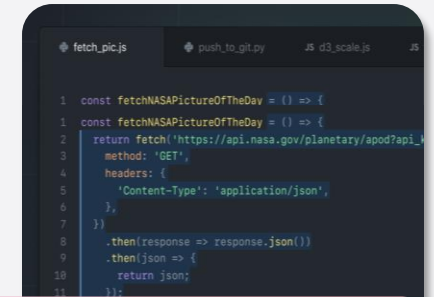
Copilot for Work
across Office 365



Biometric identity
verification



Personalized
recommendations



Copilot
assisted coding



Microsoft modernized and augmented flagship products with copilots

Build your own copilot: solution architecture



What are we building?

User experience

- ChatGPT-like interface
- Find product information from the inventory data of a fake retailer
- Users interact by asking questions and having a conversation

Tech requirements

- Fast performance
- Connect to existing business data (product, customer, order, etc)
- Manage conversational context
- Manage and store search result history
- Build and leverage custom analytics

Demo and Code

<https://aka.ms/2023DriveInConf>



Create New Chat

Available Socks

Tokens Used: 5505



Tire Catalog

Tokens Used: 3021



No bike purchases

Tokens Used: 5558



Test

Tokens Used: 1381



Tire Catalog

User

Tokens: 2755 2 days ago

Can you list the available tires in the product catalog?

Assistant

Tokens: 42 2 days ago

Sure! Based on the documents provided, the available tires in the product catalog are: - LL Road Tire - Road Tire Tube - Touring Tire Tube - ML Road Tire - ML Mountain Tire

User

Tokens: 172 21 hours ago

what are the prices for the available tires?

Assistant

Tokens: 52 21 hours ago

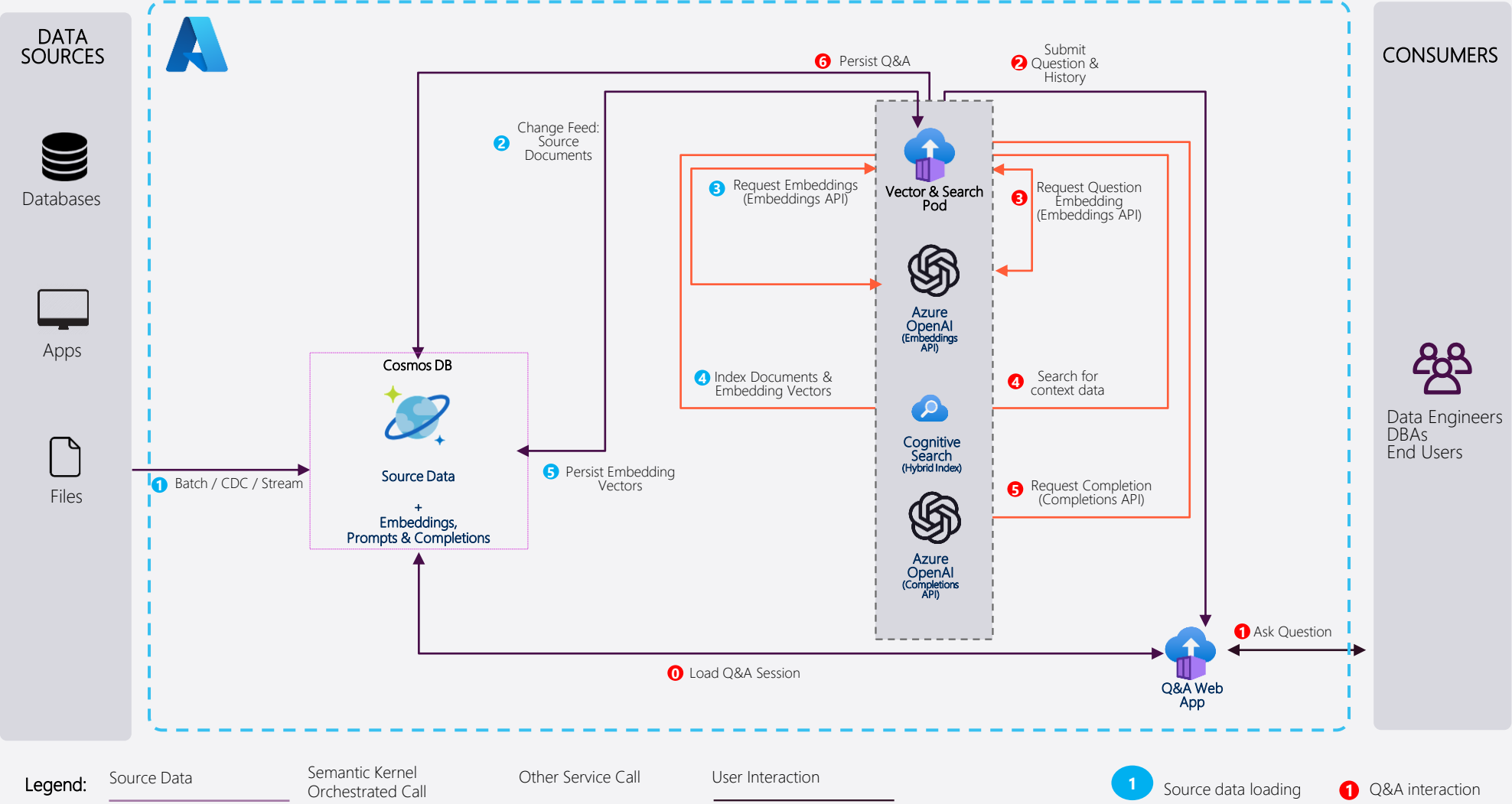
The prices for the available tires in the product catalog are: - LL Road Tire: \$30 - Road Tire Tube: \$7 - Touring Tire Tube: \$9 - ML Road Tire: \$25 - ML Mountain Tire: \$30



<Your Message>



Solution architecture: BYO copilot

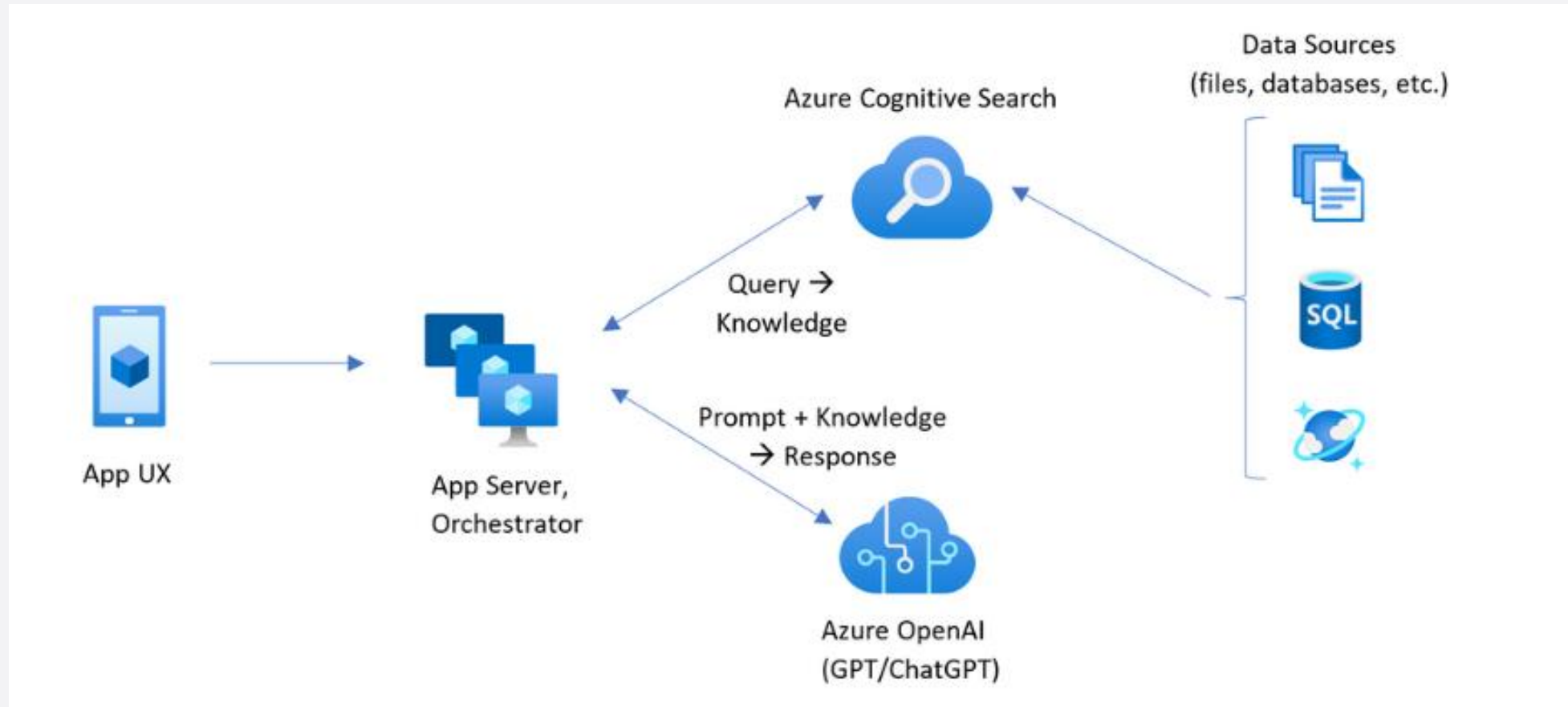


Hmmmmmm?

The question?

How is it that a LLM trained on data and fixed in time,
know about my corporate data?

Retrieval Augmented Generation (RAG)



Architecture that augments the capabilities LLM adding an information retrieval system that provides the data.

Hmmmmm v 2.0?

The question?

Prompts are limited in size. I can't supply all my data in the prompt.
What's the secret?

Prompt engineering

1. Tokens

2. Embeddings

3. Vectors

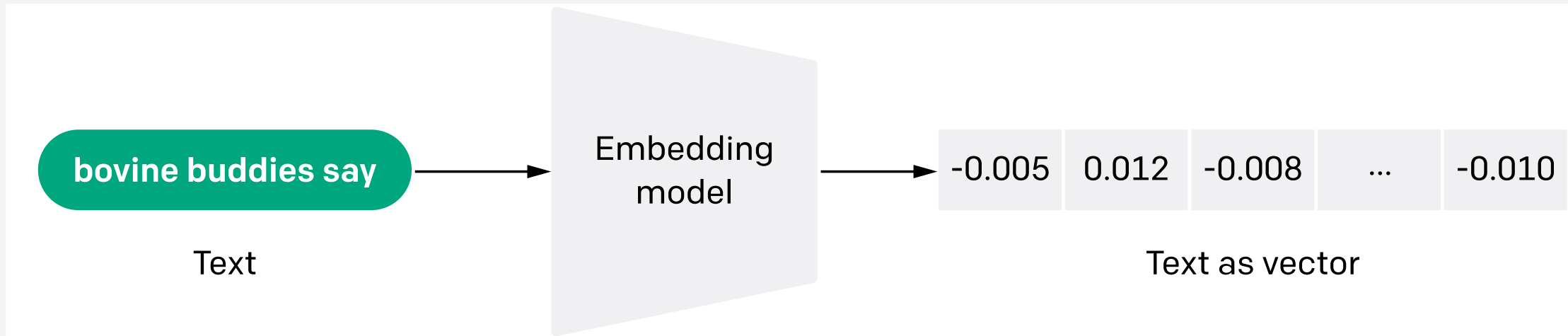
Tokens



Tokens are the basic units of text or code that an LLM AI uses to process and generate language.

OpenAI and Azure OpenAI uses a subword tokenization method called "Byte-Pair Encoding (BPE)" for its GPT-based models.

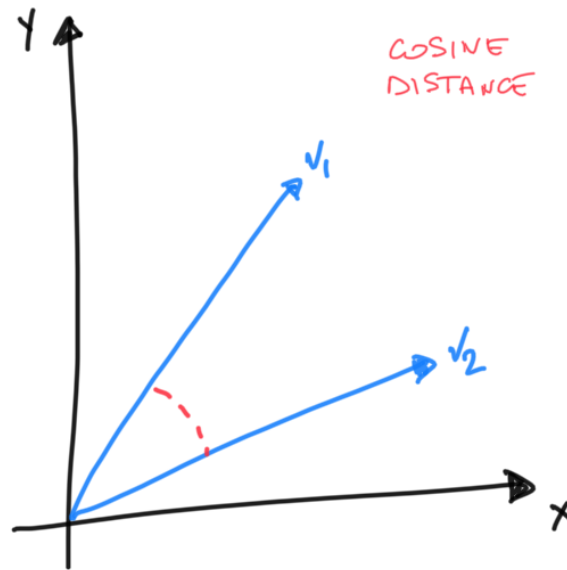
Embeddings



An embedding is a special format of data representation that machine learning models and algorithms can easily use.

The embedding is an information dense representation of the semantic meaning of a piece of text.

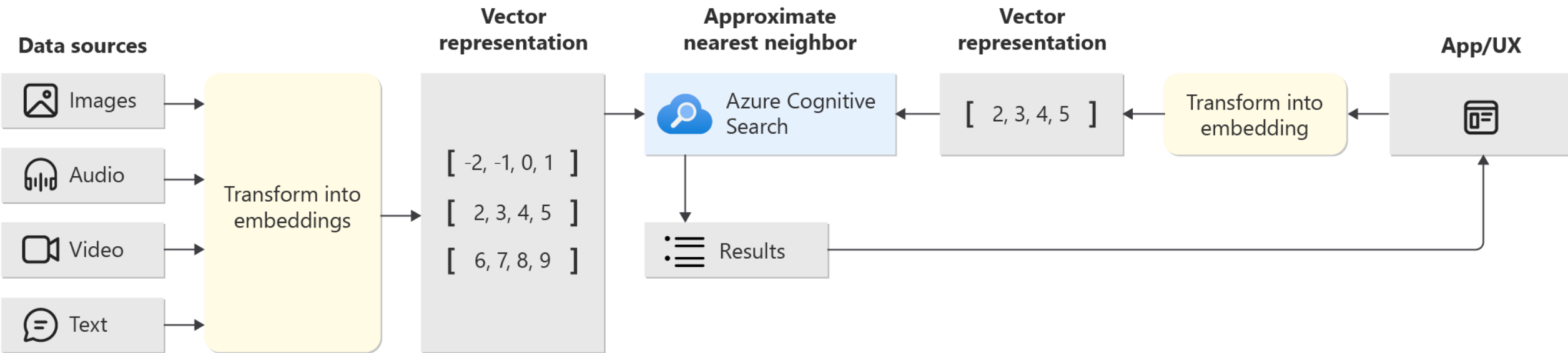
Vectors



More specifically, embeddings are vectors...hence the great interest for vector databases.

Vectors represent similar object is as easy as calculating the distance between the vectors.

Vector Search



Indexing, storing, and retrieving vector embeddings from a search index. You can use it to power similarity search, multi-modal search, recommendations engines, or applications implementing the Retrieval Augmented Generation (RAG) architecture.

Text similarity models

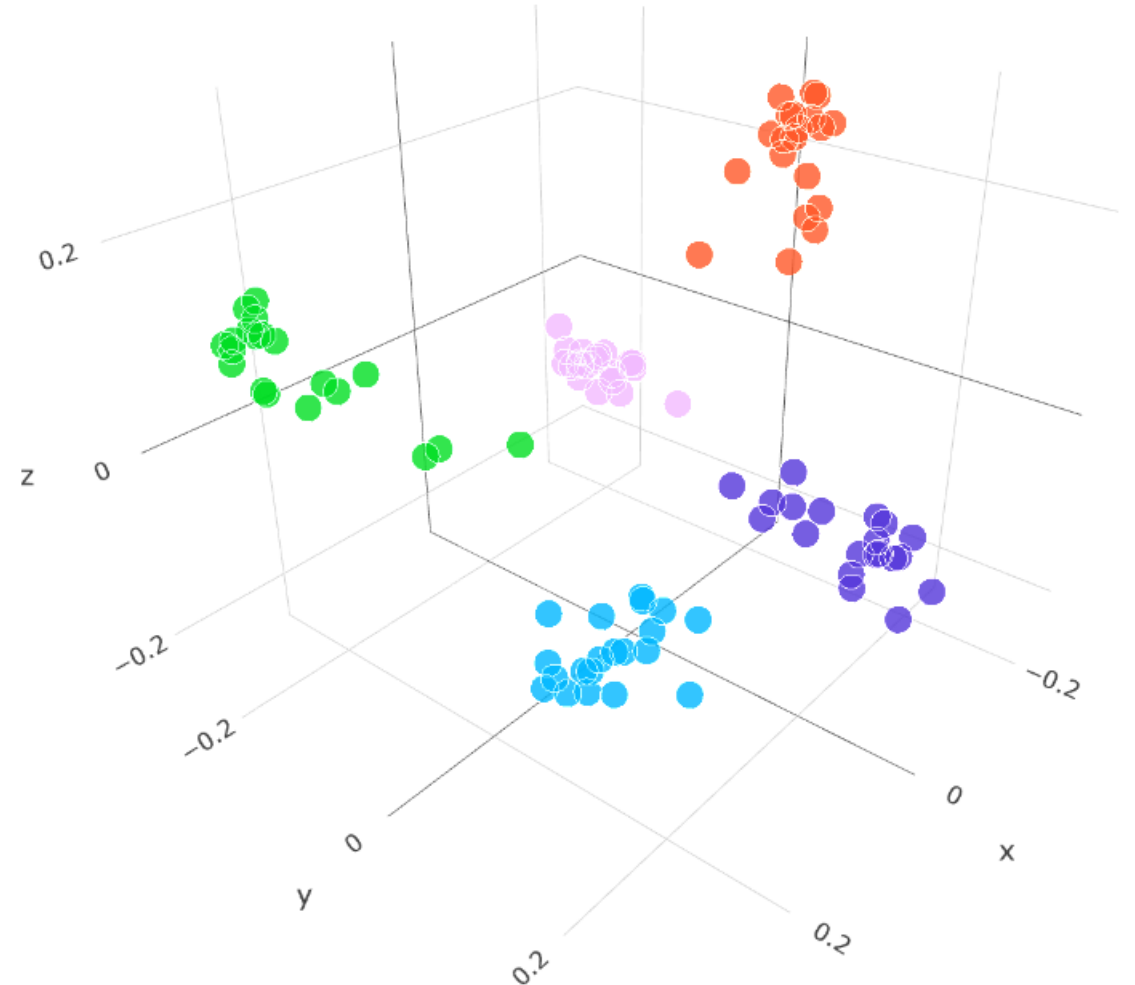
Embeddings from the text-similarity-babbage-001 model, applied to the DBpedia dataset.

We randomly selected 100 samples from the dataset covering 5 categories and computed the embeddings via the /embeddings endpoint. The different categories show up as 5 clear clusters in the embedding space.

To visualize the embedding space, we reduced the embedding dimensionality from 2048 to 3 using PCA.

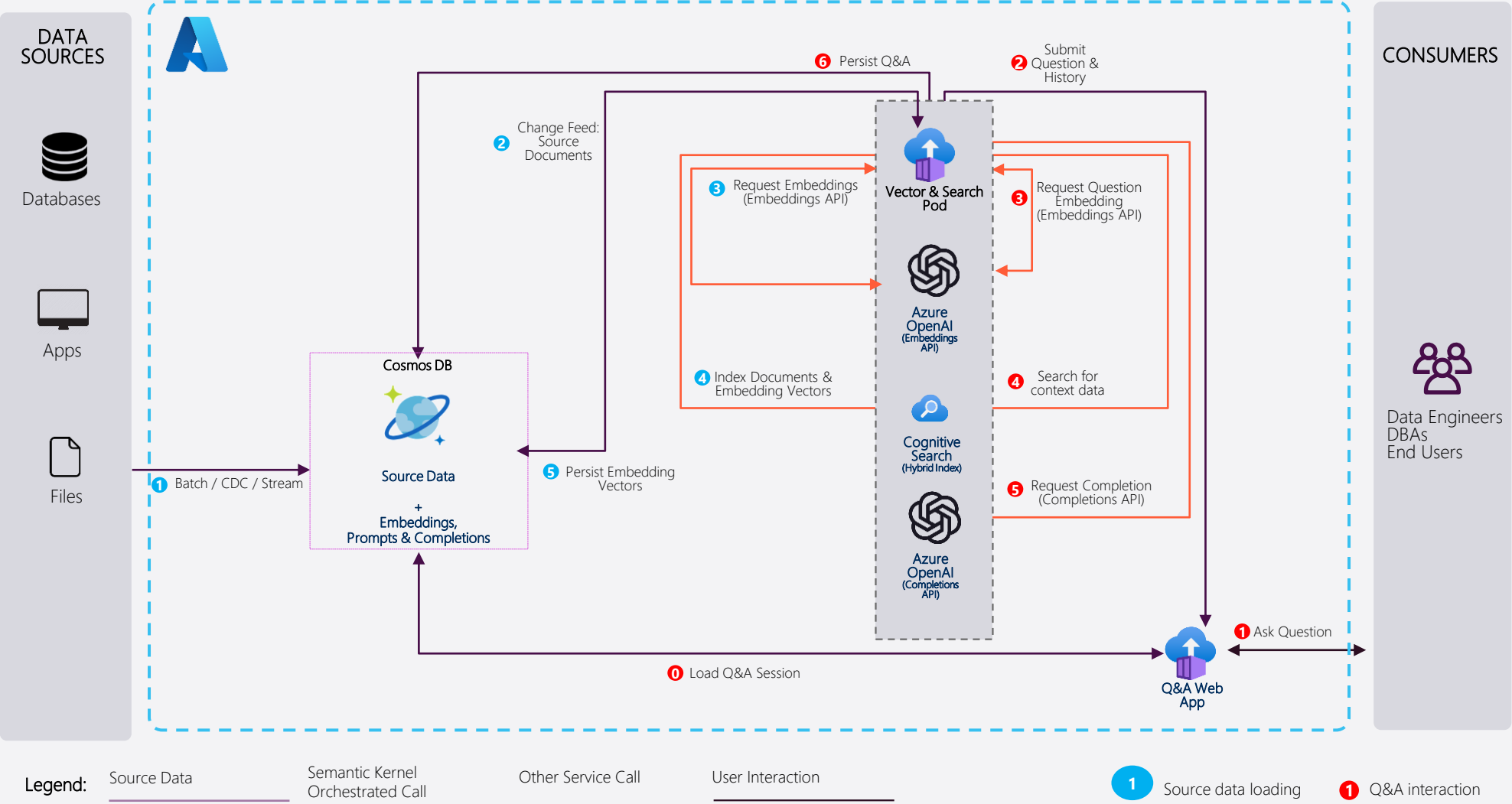
The code for how to visualize embedding space in 3D dimension is available [here](https://openai.com/blog/introducing-text-and-code-embeddings).

animal athlete film transportation village



Principal Component Analysis - Linear dimensionality reduction using Singular Value Decomposition of the data to project it to a lower dimensional space.

Solution architecture: BYO copilot



Solution architecture: BYO copilot hero products



Azure AI Services
(Azure OpenAI
Service & Azure
Cognitive Search)

- Generates ChatGPT responses to natural language questions
 - Creates embeddings that describe similarities between data
 - Indexes data to make it more easily searchable
-



Azure
Cosmos DB

- Stores transactional data to be queried
 - Generates vectors on the stored data
 - Stores user prompt and completion history
 - Enables conversational memory: follow-up questions and user conversations
 - Can dynamically add and remove data to enable real-time AI
-



Azure
Container
Apps



Azure
Kubernetes
Service

- Receives questions, and routes to Azure OpenAI Service
- Initiates searches for contextual data



Thank you

