

# Building intelligent and magic-like solutions using Azure OpenAl Services

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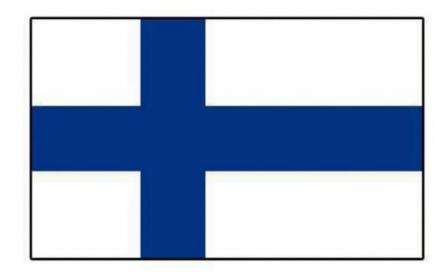
Fundamentals of Azure OpenAl and Generative Al

Insert Azure OpenAl into anything

Custom data

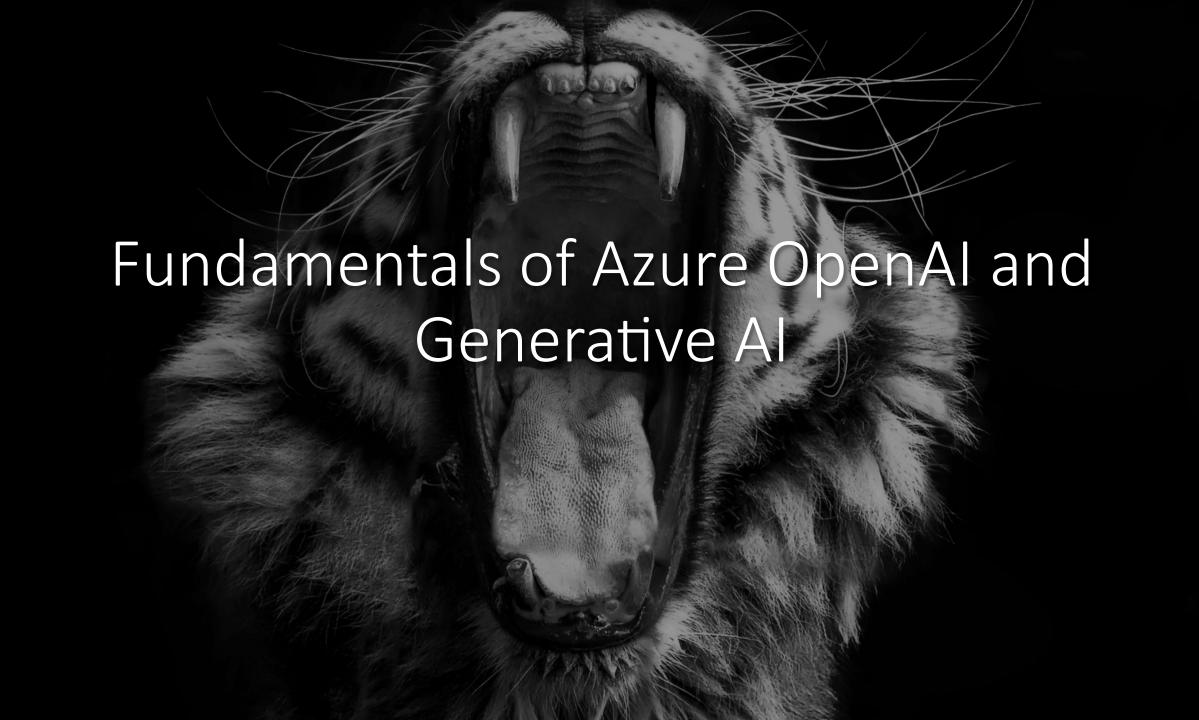
Security, privacy and cost estimation

#### WHAT FINLAND'S FLAG STANDS FOR









#### What is OpenAl?



Ensure that artificial general intelligence (AGI) benefits humanity.

OpenAl is an Al research laboratory

• They've introduced models such as DALL-E, GPT-3, GPT-3.5, GPT 4 and Codex

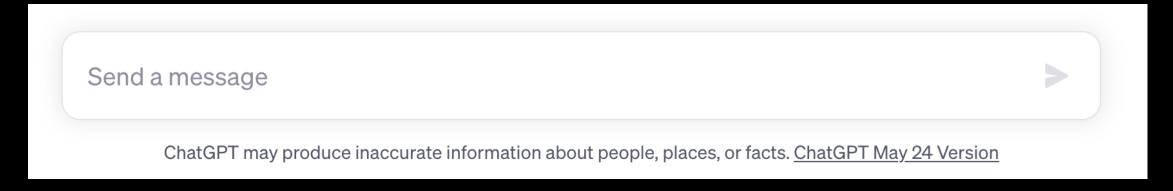
In late 2022, they launched ChatGPT – a new generative Al service

Based on GPT-3 and then GPT-3.5 Turbo

GPT Codex DALL-E ChatGPT

#### And what is ChatGPT?

It's the most exciting service launched in years – a textbox!



Magic-like AI chatbot capability, yet still a black box essentially. How does it work? Nobody knows.

Free and paid subscription available - available at <a href="https://chat.openai.com">https://chat.openai.com</a>

#### Why do I love ChatGPT?

How to increase number of open files in Azure ARM template for container instance

```
--memory 1 \
--cpu 1 \
--ulimit nofile=65535:65535
```

"Hello all, I wanted to clarify this issue. Proposed solutions are based on GPT search results that seem invalid."

#### What is Azure OpenAl, then?

Azure OpenAl, in contrast to OpenAl, is a REST API providing access to the same OpenAl models

Secured with Entra ID and all the goodness of Azure security.

Available in most regions now – West Europe, Sweden Central, UK South, France Central, East US, etc.

To get access, you have to apply for Azure OpenAI, and then apply for the more advanced models: <a href="https://aka.ms/oai/access-&-https://aka.ms/oai/get-gpt4">https://aka.ms/oai/access-&-https://aka.ms/oai/get-gpt4</a>

Differences with OpenAI: private networking, privacy, encryption, regional availability, PaaS-like configuration.



GPT

Codex

DALL-E

ChatGPT

#### What are Large Language Models?

### Large Language Models consist of artificial neural networks

• And these include tens of millions, or billions of parameters

Trained on text – such reddit.com, GitHub, Wikipedia, and so on.

Pre-trained, so inherently and by design, on a large corpus

• To put it simply, predicting the next word in a sentence.

Input and output is numbers – so words have to be tokenized in a tokenizer map

- 1 token maps to ~4 characters (~0.75 words), at least in English
  - Hi from Finland: laskuvarjojääkärikokelas

GPT-3 and GPT-4

Davinci: Most capable

Curie: Very capable, but faster

**Babbage**: Very straightforward and very fast

Ada: Simple tasks, fastest

**GPT-4**: Greater accuracy, supports more tokens

Let's talk a bit about the models

Codex

**Davinci-codex:** Best for applications needing deep understanding of code

**Cushman-codex:** Powerful and fast, better for generating code

**ChatGPT** 

**ChatGPT:** Designed for conversational interfaces – conversation in, message out.

# What are prompts, and prompt engineering?

You interact with the models almost solely through prompts

Prompt → model → completion

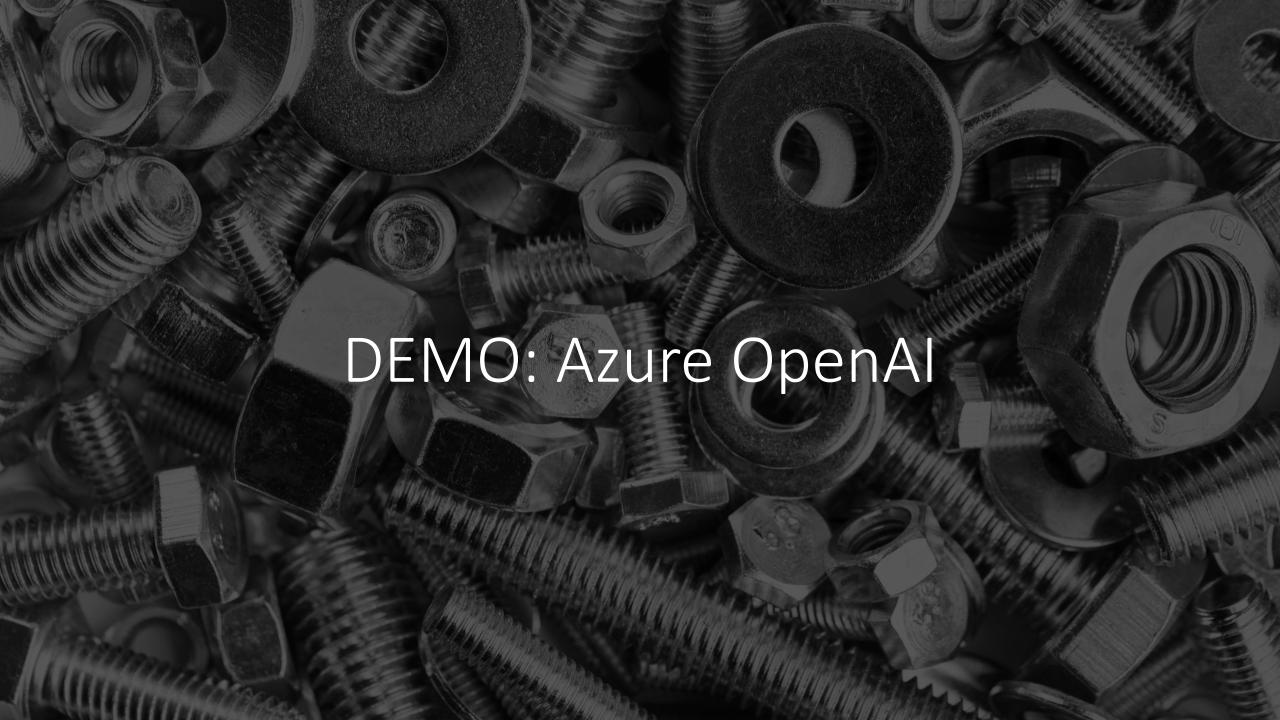
The first prompt I used back in the day:

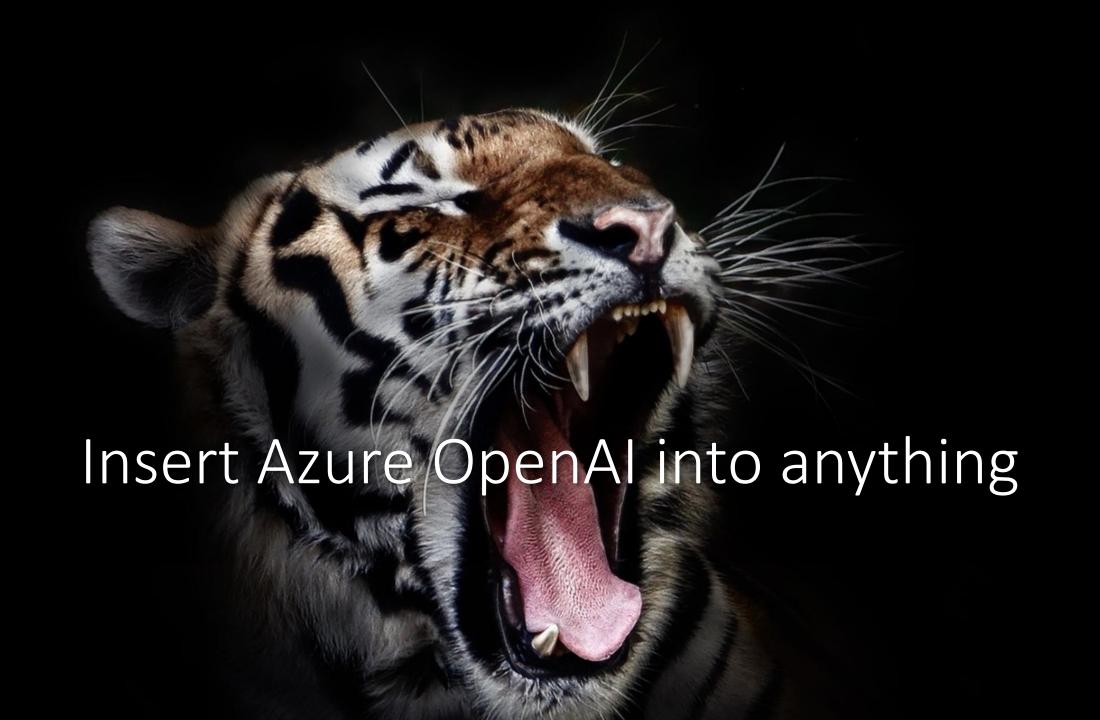
"What does WTF stand for?"

Prompt engineering is more art than strict science

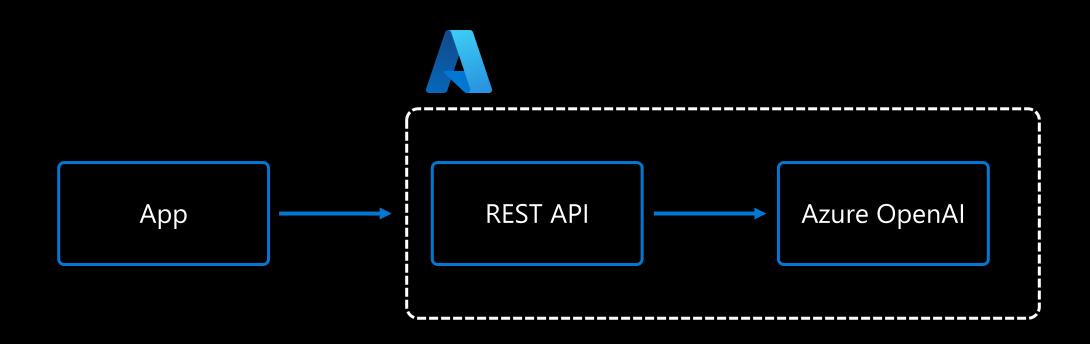
 Prompts vary from simple to complex, and they can be vastly comprehensive and detailed – see https://learn.microsoft.com/en-us/azure/cognitiveservices/openai/concepts/prompt-engineering

Prompts count for the number of tokens consumed.





#### A word about the architecture



#### Connecting to Azure OpenAl – basic approach



A traditional REST API – requires an API Key, API version, and optional parameters (such as max\_tokens).

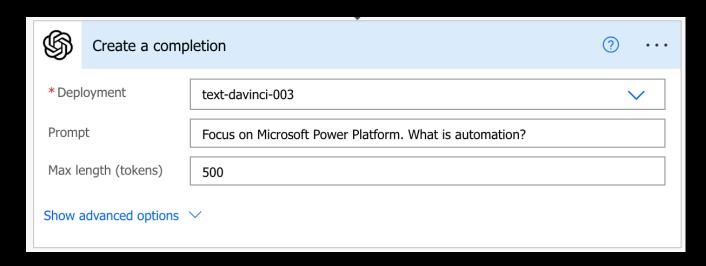


Don't forget what Azure can offer: API Management and Azure Functions to abstract the actual logic.



Test directly via Azure AI Studio, or with any command line tool: curl is a fantastic option!

## Connecting to Azure OpenAl with Logic Apps and Power Automate



You can utilize the Custom Connector – by Daniel Laskewitz, Andrew Coates and Robin Rosengrün

https://github.com/microsoft/PowerPlatformConnectors/tree/dev/custom-connectors/AzureOpenAlService

#### Use cases for Azure OpenAl

**Chatbots** 

Power Virtual Agents

Embedded chat agents

Custom web apps

Injecting intelligence

Canvas & model-driven apps

Augmenting workflows

Enriching content & data

Accelerating business

Multiple LLMs as part of a solution

Custom Copilots

Industry— specific tools





### Custom data



#### Why custom data? Doesn't GPT know everything?



GPT models know too much – and then they start to hallucinate.

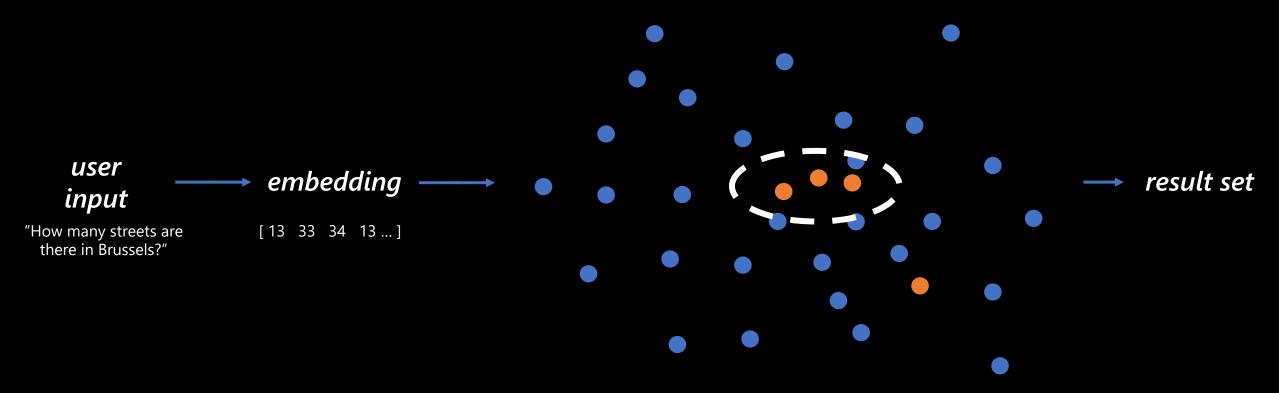


Custom data aims to guardrail and contain the information.



The idea is to add custom data, <u>and</u> control the level of <u>hallucination at the same time</u>.

#### About embeddings and vectors

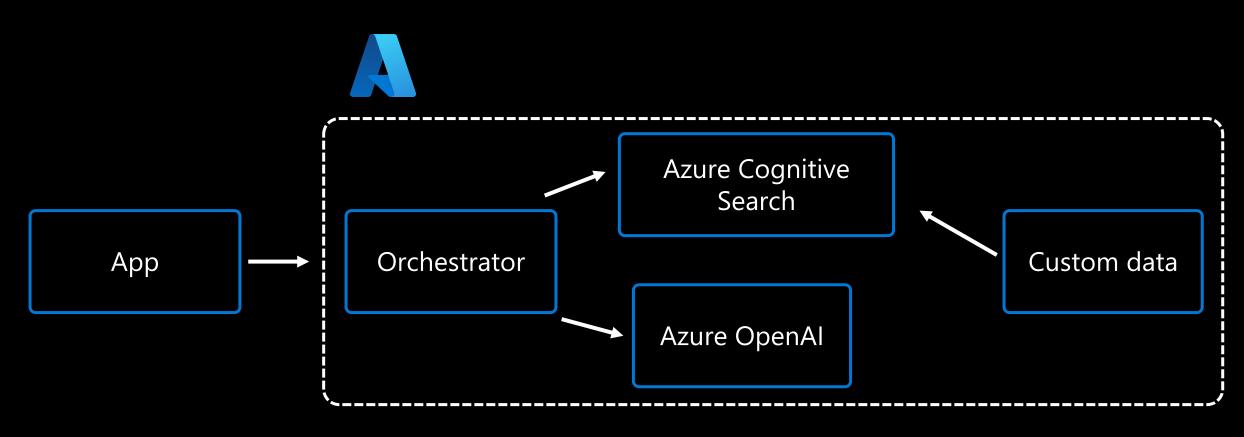


Representation of text in semantic meaning

Vectors (arrays of numbers) – think of them as points on a line, and similar text has shorter distance with each other.

#### About RAG and grounding

Retrieval Augmented Generation is a fancy phrase for "just do what I tell you, and don't forget that!". Generative AI does not have context.



#### Custom data and cracking documents



Embedding your data requires that text and content is tokenized, and stored as vectors



Vectors for embedding data can be generated with the help of Azure OpenAI, or additional tools



Vectors have to be stored in a database, such as Pinecone or Redis with RediSearch. Azure SQL works also.



#### Fine tuning



Instead of embedding data, you can also fine-tune the existing LLM models.



It's a time consuming and often costly effort, but might yield best results in specific scenarios.



Data must be formatted as JSONL – JSON with Line breaks.

```
{"prompt": "How to optimize making filtered coffee at home with a
  Moccamaster", "completion": "Water the filter paper"}

{"prompt": "How to make best coffee on a Moccamaster", "completion": "Use
  cold and clean water"}
```

#### Fine tuning process

#### Status: ⊘ Training succeeded

Finished training on: 3/17/2023 1:51 PM

Training file: coffee-azure-openai.jsonl

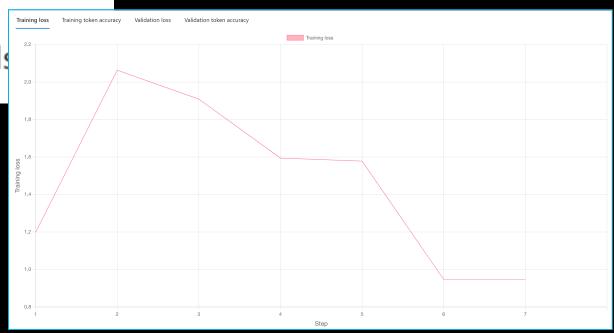
Base model: curie

Total training time: 35 minutes, 46 seconds

Statistics:

Total tokens: 159

Total examples: 7







#### What happens with my data?



Azure OpenAl processes prompts, completions, training & validation data, and results from trainings

 No data is used to train the models – also no data is sent to OpenAl

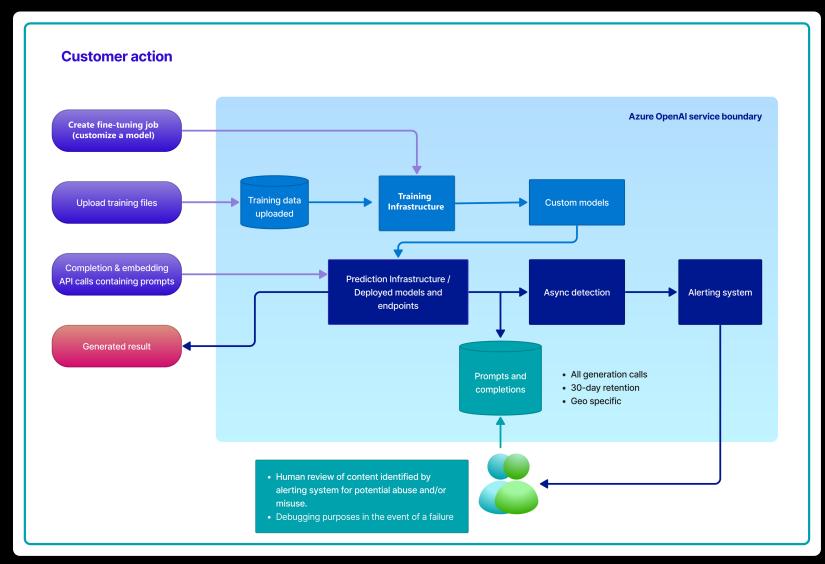


Prompts and completion are temporarily stored for up to 30 days – it's encrypted.



All other data, such as custom data and training, is encrypted and isolated within the Azure subscription

#### How is my data managed?



Source: Microsoft

#### What data should you use with Azure OpenAl?



Sensitive data <u>can</u> be used – as opposed to <u>cannot</u> be used with OpenAI (the service)



Encrypt all data, as you would usually anyway when you store it in cloud.



At a certain point, you have to trust Microsoft – customer-managed key will be available (with Key Vault support)

https://aka.ms/cogsvc-cmk

#### Security capabilities to consider



Bind your Azure OpenAl instances to private endpoints or VNETs you control  $\rightarrow$  closed from the public Internet



Managed Identities should be used when possible



Build monitoring around Azure OpenAl instance use – tokens used, total calls, total errors, blocked calls, etc.

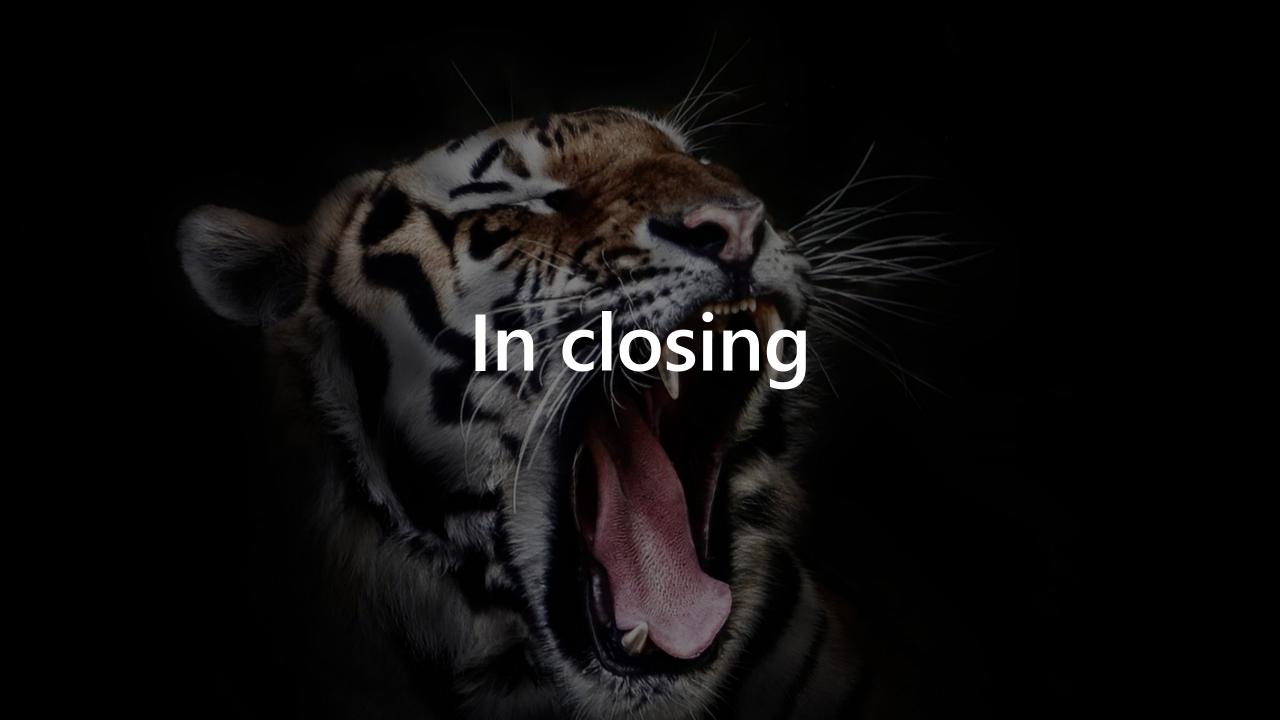
## What about costs?

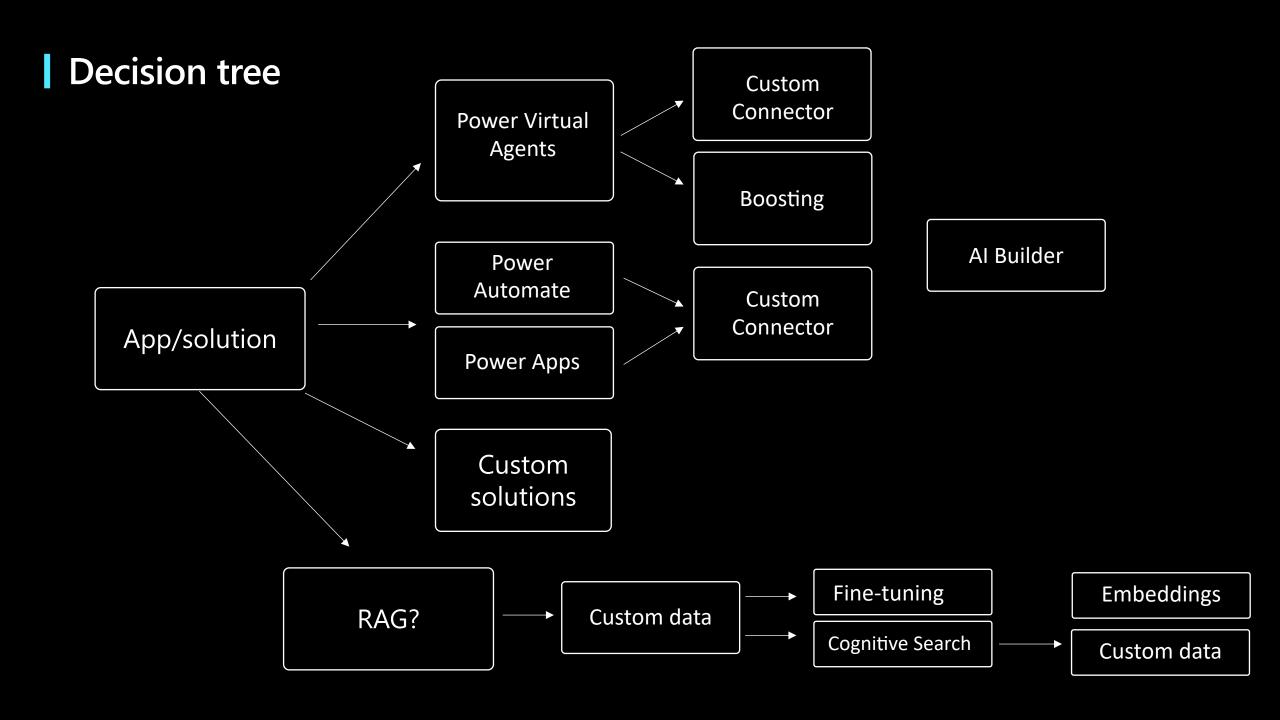
Tokens will cost you – per 1000 tokens, and depending on which LLM models you are using.

GPT-3.5-Turbo – 0.0020 € (completion) GPT-4 8K – 0.058 € (completion)

Factor in that tokens are consumed in RAG, and if you build a memory, it adds up *quite* quickly.

Azure Cognitive Search is about 233 €/month, fixed.





**Azure Al Studio** 

Azure Machine Learning Studio

Azure Cognitive Search

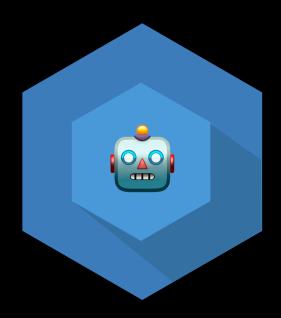
# Tooling and projects - recap

Your private ChatGPT in Azure - <a href="https://github.com/microsoft/azurechat">https://github.com/microsoft/azurechat</a>

Chat with your data - <a href="https://github.com/Azure-Samples/chat-with-your-data-solution-accelerator">https://github.com/Azure-Samples/chat-with-your-data-solution-accelerator</a>

Enterprise end-to-end demo-https://github.com/Azure-Samples/azure-searchopenai-demo

#### Now, go and build something!



Start building with Azure OpenAI – today!



Learn to use RAG – it's key for memory, and brings more "intelligence" for your solutions.



For custom data, things will become easier in the future.

## Thank you!

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