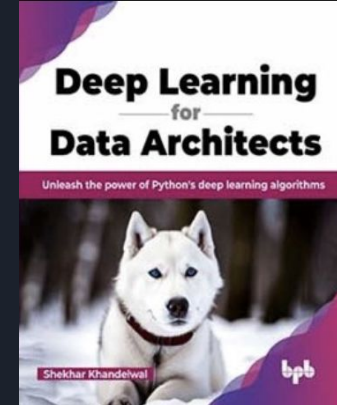
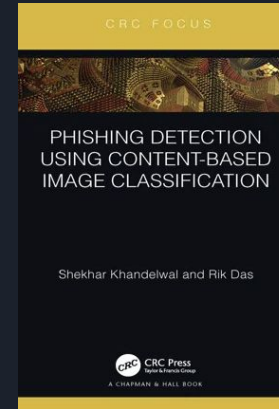


Shekhar Khandelwal
Senior Data Scientist
Hamburg, Germany

15+ years industry experience
Ex Accenture - IBM - EY
Currently MMT GmbH, Germany

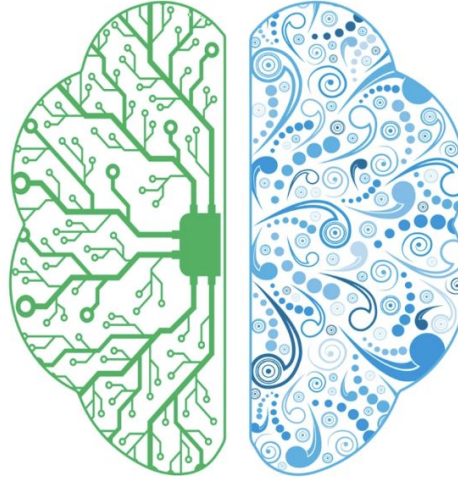
Linkedin: <https://www.linkedin.com/in/shekhar-khandelwal-05310130/>

Medium: <https://medium.com/@khandelwal-shekhar>



Predictive AI

Predictive algorithms that, among other things, can assign probabilities, categorize outcomes, and support decisions

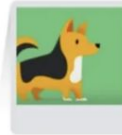


Generative AI

Generative algorithms that, among other things, can create text or images of human-level quality in response to prompts or requests for synthesis

Source: BCG analysis.

Discriminative technique



Classify

Discriminative model
(classify as a dog or a cat)

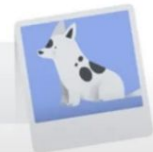


Generative technique

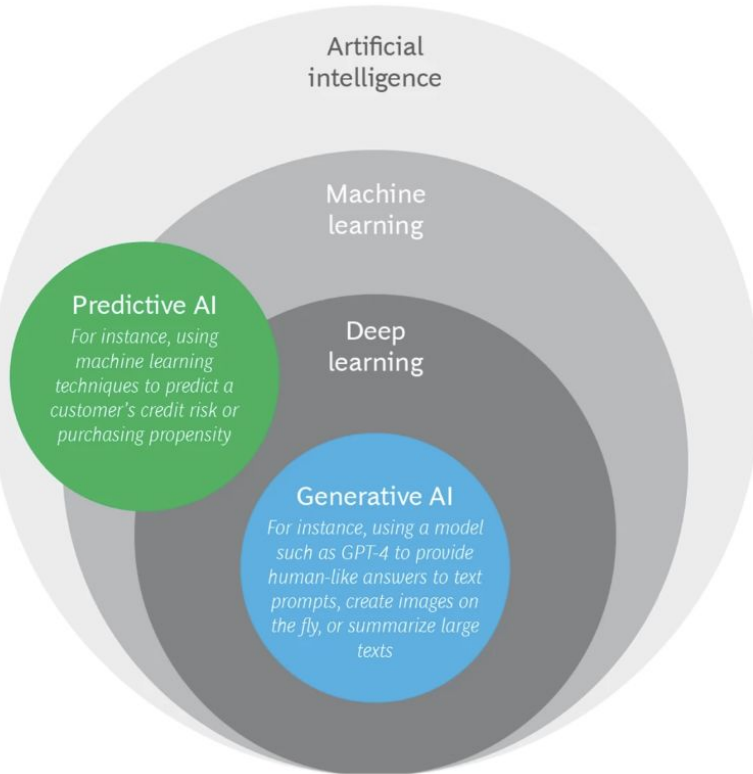


Generate

Generative model
(generate dog image)



Disclaimer: All images are borrowed from web for better conceptual understanding.



Source: BCG analysis.



Artificial intelligence. A broad term for nonhuman "intelligence" or problem-solving ability embedded in machines or software.



Machine learning. A subset of artificial intelligence algorithms in which computers figure out how to tackle problems and discover solutions independently, often by using artificial neural networks.



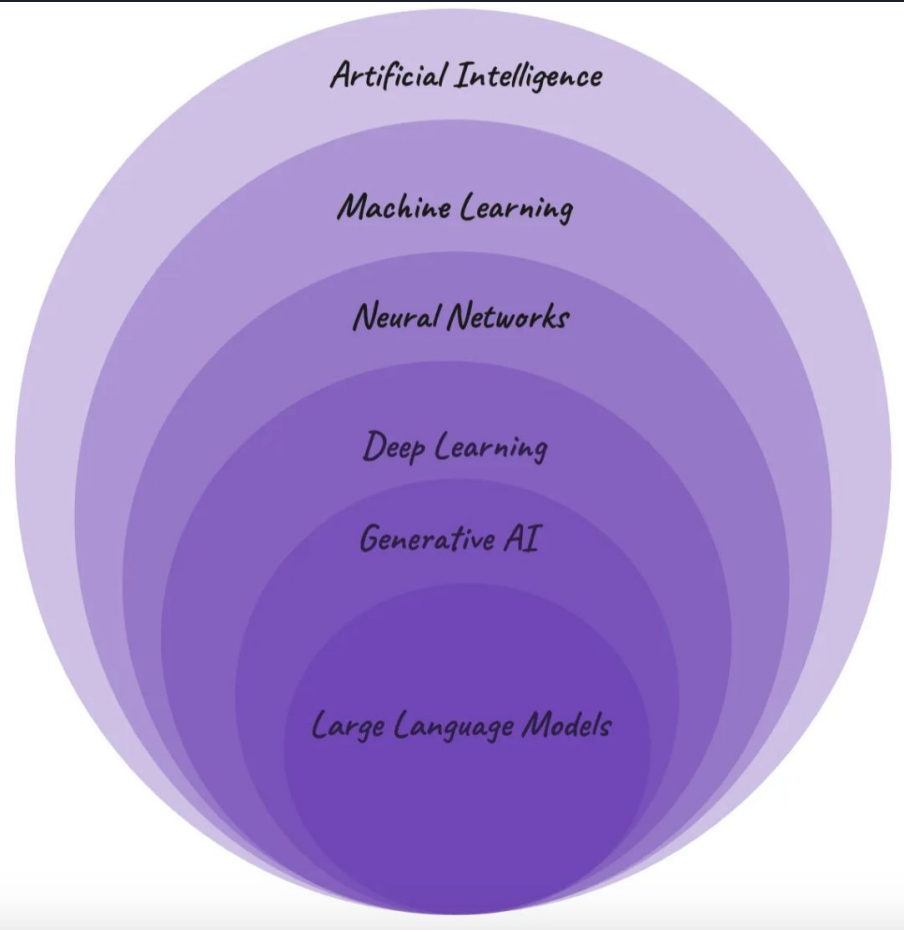
Deep learning. A subset of machine learning algorithms in which computers leverage multilayer ("deep") artificial neural networks to perform complex learning tasks that in many cases involve large amounts of text or images.



Generative AI (GenAI). A subset of deep learning algorithms in which computers focus on generating apparently new, realistic content from unstructured inputs such as text, images, or audio. Widely known examples include ChatGPT (for text) and DALL-E (for images).



Predictive AI. Predictive modeling techniques that are widespread in industries such as banking and that can leverage a variety of AI techniques, sometimes including machine learning or deep learning.



Disclaimer: All images are borrowed from web for better conceptual understanding.

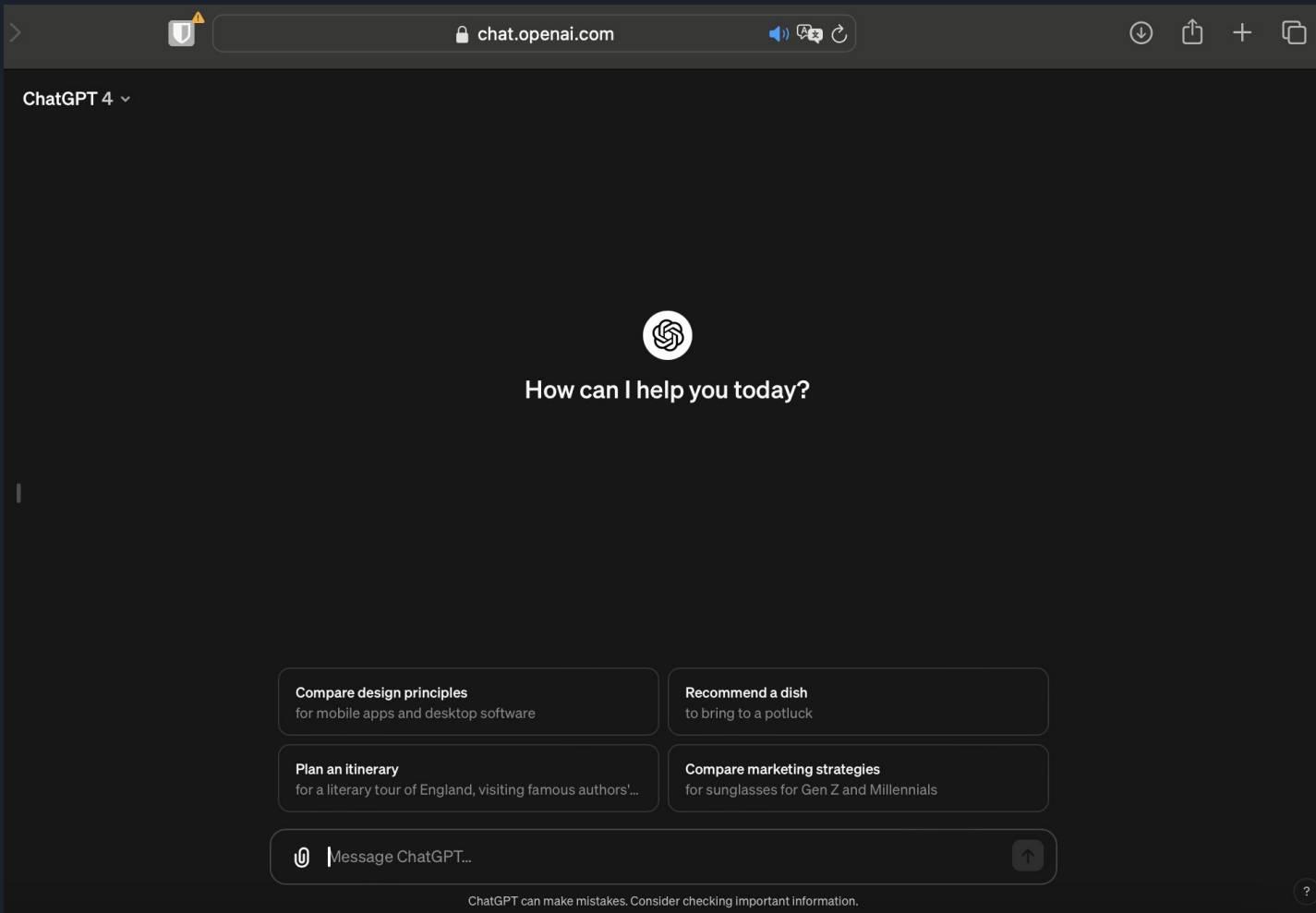
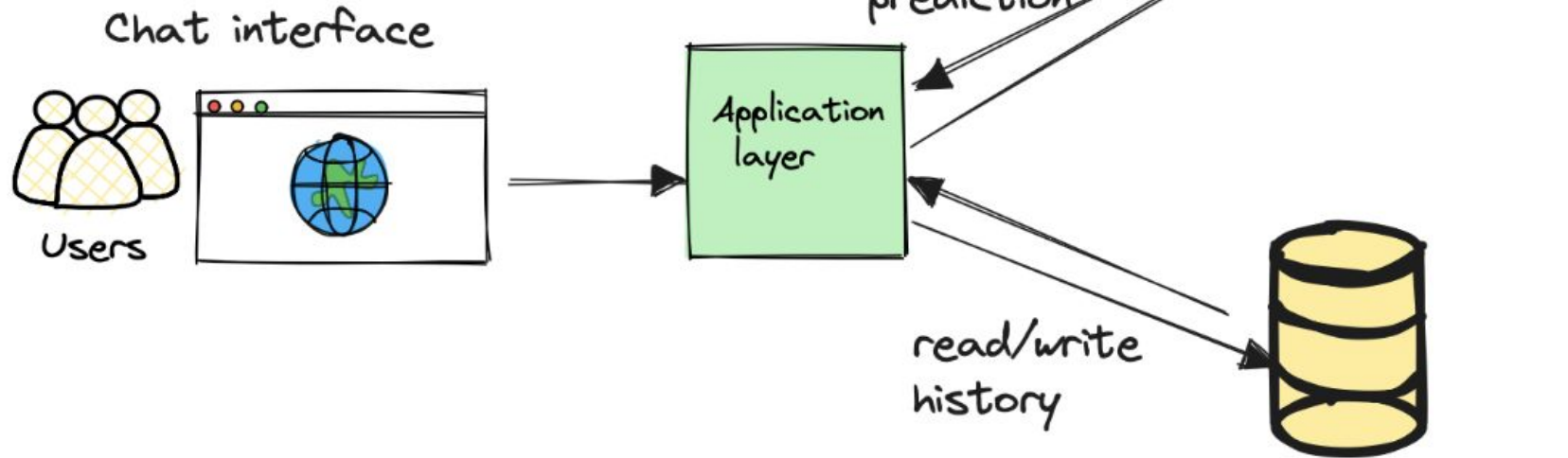


Image by author

CHATGPT SYSTEM DESIGN





🔍 K

GET STARTED[Introduction](#)[Quickstart](#)**Models**[Overview](#)[Model updates](#)[GPT-4](#)[GPT-3.5 Turbo](#)[DALL-E](#)[TTS](#)[Whisper](#)[Embeddings](#)[Moderation](#)[GPT Base](#)[How we use your data](#)[Endpoint compatibility](#)[Tutorials](#)[Changelog](#)

Overview

The OpenAI API is powered by a diverse set of models with different capabilities and price points. You can also make customizations to our models for your specific use case with [fine-tuning](#).

MODEL	DESCRIPTION
GPT-4 and GPT-4 Turbo	A set of models that improve on GPT-3.5 and can understand as well as generate natural language or code
GPT-3.5 Turbo	A set of models that improve on GPT-3.5 and can understand as well as generate natural language or code
DALL-E	A model that can generate and edit images given a natural language prompt
TTS	A set of models that can convert text into natural sounding spoken audio
Whisper	A model that can convert audio into text
Embeddings	A set of models that can convert text into a numerical form
Moderation	A fine-tuned model that can detect whether text may be sensitive or unsafe
GPT base	A set of models without instruction following that can understand as well as generate natural language or code
Deprecated	A full list of models that have been deprecated along with the suggested replacement

We have also published open source models including [Point-E](#), [Whisper](#), [Jukebox](#), and [CLIP](#).

Application development using OpenAI API

ChatCompletions ▾

 Copy

```
1  from openai import OpenAI
2  client = OpenAI()
3
4  completion = client.chat.completions.create(
5      model="gpt-3.5-turbo",
6      messages=[
7          {"role": "system", "content": "You are a poetic assistant, skilled in explaining
8          {"role": "user", "content": "Compose a poem that explains the concept of recursio
9      ]
10 )
11
12 print(completion.choices[0].message)
```


[Speech-to-text](#)[Moderation](#)

ASSISTANTS

[Overview](#)[How Assistants work](#)[Tools](#)

GUIDES

[Prompt engineering](#)[Production best practices](#)[Safety best practices](#)

Rate limits

[Overview](#)[Usage tiers](#)[Error mitigation](#)

Usage tiers

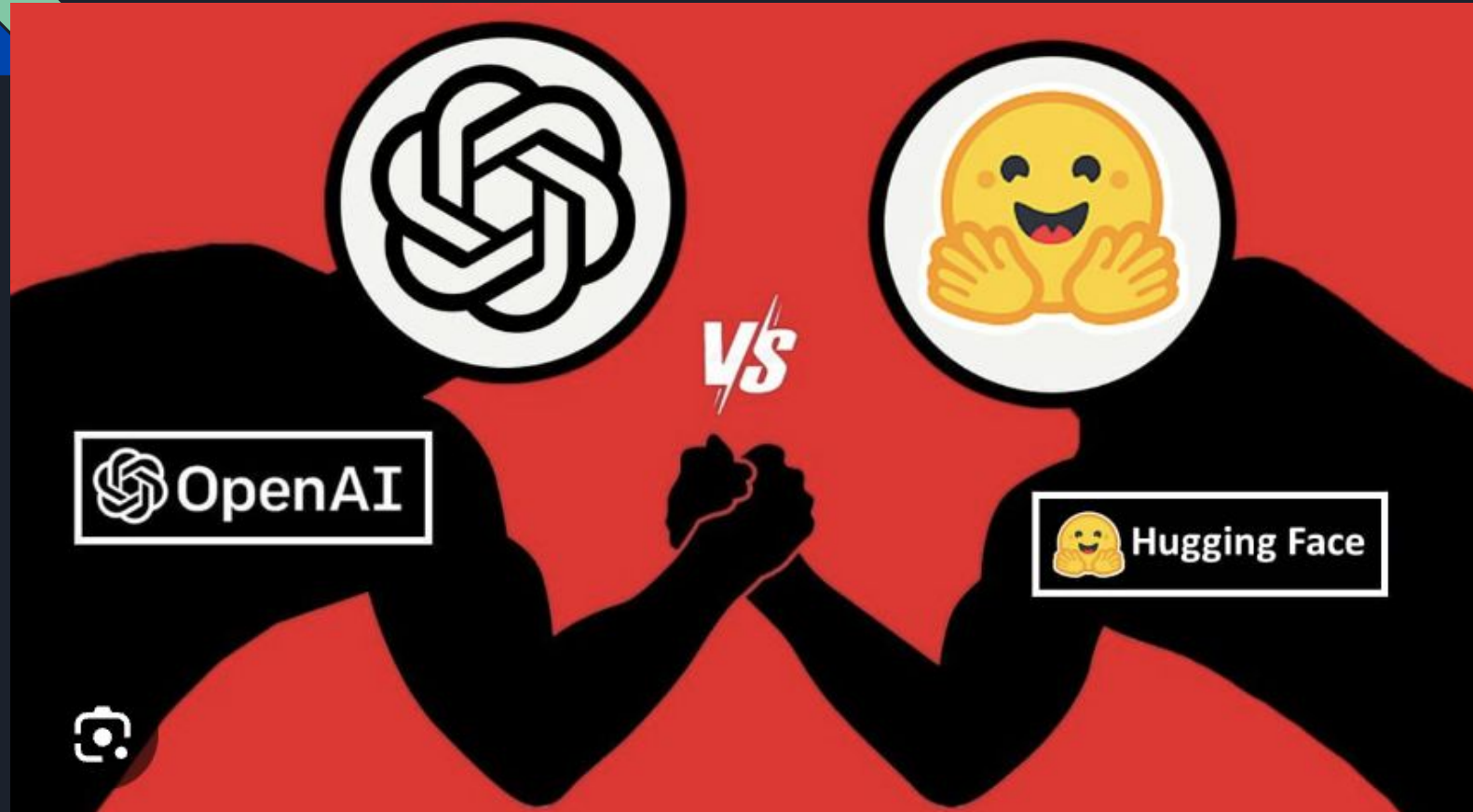
You can view the rate and usage limits for your organization under the [limits](#) section of your account settings. As your usage of the OpenAI API and your spend on our API goes up, we automatically graduate you to the next usage tier. This usually results in an increase in rate limits across most models.

TIER	QUALIFICATION	USAGE LIMITS
Free	User must be in an allowed geography	\$100 / month
Tier 1	\$5 paid	\$100 / month
Tier 2	\$50 paid and 7+ days since first successful payment	\$500 / month
Tier 3	\$100 paid and 7+ days since first successful payment	\$1,000 / month
Tier 4	\$250 paid and 14+ days since first successful payment	\$5,000 / month
Tier 5	\$1,000 paid and 30+ days since first successful payment	\$10,000 / month

Select a tier below to view a high-level summary of rate limits per model.

[Free](#)[Tier 1](#)[Tier 2](#)[Tier 3](#)[Tier 4](#)[Tier 5](#)

Proprietary vs Open Source



Hugging Face - Open Source Model Repository

The screenshot shows the Hugging Face website interface. At the top, the browser address bar displays 'huggingface.co/models'. The website header includes the Hugging Face logo, a search bar, and navigation links for Models, Datasets, Spaces, Posts, Docs, Solutions, Pricing, and a 'Finish update' button. A yellow banner below the header reads 'Hugging Face is way more fun with friends and colleagues! Join an organization'. The main content area is divided into a left sidebar and a main grid. The sidebar contains filters for Tasks (Multimodal, Computer Vision, Natural Language Processing), Libraries, Datasets, Languages, Licenses, and Other. The main grid displays a list of models, including 'metavoiceio/metavoice-18-v0.1', 'openbmb/MiniCPM-2B-sft-fp32', 'mistralai/Mixtral-8x7B-Instruct-v0.1', 'stabilityai/stable-cascade', 'CohereForAI/aya-101', 'allenai/OLMo-7B', 'BAAI/bge-m3', 'time-series-foundation-models/Lag-Llama', 'meta-llama/Llama-2-7b-chat-hf', 'briaai/RMBG-1.4', 'abacusai/Smaug-72B-v0.1', 'miqudev/miqu-1-70b', 'stabilityai/stable-video-diffusion-img2vid-xt-1-1', 'ShinojiResearch/Senku-70B-Full', 'nvidia/canary-1b', 'nomic-ai/nomic-embed-text-v1', and 'stabilityai/stable-diffusion-xl-base-1.0'. Each model card shows the model name, task, update time, and statistics.

Hugging Face Search models, datasets, users...

Models Datasets Spaces Posts Docs Solutions Pricing ~≡

Hugging Face is way more fun with friends and colleagues! Join an organization Dismiss this message

Tasks Libraries Datasets Languages Licenses Other

Filter Tasks by name

Multimodal

- Feature Extraction Text-to-Image Image-to-Text
- Image-to-Video Text-to-Video
- Visual Question Answering
- Document Question Answering Graph Machine Learning
- Text-to-3D Image-to-3D

Computer Vision

- Depth Estimation Image Classification
- Object Detection Image Segmentation
- Image-to-Image Unconditional Image Generation
- Video Classification Zero-Shot Image Classification
- Mask Generation Zero-Shot Object Detection


Natural Language Processing

- Text Classification Token Classification
- Table Question Answering Question Answering
- Zero-Shot Classification Translation
- Summarization Conversational
- Text Generation Text2Text Generation Fill-Mask

Models 505,670 Filter by name new Full-text search 11 Sort: Trending


- metavoiceio/metavoice-18-v0.1**
Text-to-Speech · Updated 3 days ago · ± 1.81k · ♥ 442
- openbmb/MiniCPM-2B-sft-fp32**
Text Generation · Updated 10 days ago · ± 33.6k · ♥ 228
- mistralai/Mixtral-8x7B-Instruct-v0.1**
Text Generation · Updated Dec 15, 2023 · ± 1.04M · ♥ 2.84k
- stabilityai/stable-cascade**
Text-to-Image · Updated about 5 hours ago · ♥ 108
- CohereForAI/aya-101**
Text2Text Generation · Updated about 4 hours ago · ± 8 · ♥ 99
- allenai/OLMo-7B**
Text Generation · Updated 3 days ago · ± 8.62k · ♥ 462
- BAAI/bge-m3**
Sentence Similarity · Updated 2 days ago · ± 293k · ♥ 367
- time-series-foundation-models/Lag-Llama**
Updated 6 days ago · ♥ 68
- meta-llama/Llama-2-7b-chat-hf**
- briaai/RMBG-1.4**
Image-to-Image · Updated about 24 hours ago · ± 68 · ♥ 397
- abacusai/Smaug-72B-v0.1**
Text Generation · Updated 4 days ago · ± 3.62k · ♥ 251
- miqudev/miqu-1-70b**
Updated 9 days ago · ♥ 875
- stabilityai/stable-video-diffusion-img2vid-xt-1-1**
Image-to-Video · Updated 8 days ago · ± 4.26k · ♥ 265
- ShinojiResearch/Senku-70B-Full**
Text Generation · Updated 2 days ago · ± 1.01k · ♥ 90
- nvidia/canary-1b**
Automatic Speech Recognition · Updated 4 days ago · ± 1.61k · ♥ 79
- nomic-ai/nomic-embed-text-v1**
Sentence Similarity · Updated 5 days ago · ± 28.4k · ♥ 232
- stabilityai/stable-diffusion-xl-base-1.0**
Text-to-Image · Updated Oct 30, 2023 · ± 4.49M · ♥ 4.4k
- mistralai/Mixtral-8x7B-v0.1**


Hugging Face Chat

 HuggingChat


New Chat

This week

 Langchain Python code for gen

 Dragon description

This month

 Python code for fibonacci numb

shekharkhandelwal


Theme

Assistants

New

Settings

About & Privacy



Assistant

LLMs Expert

you are a digital mentor designed to navigate the intricate world of large language models (LLMs) and artificial intelligence (AI) for students of all levels. With its sleek, modern design, EduBot embodies the perfect balance of intelligence and accessibility. Its appearance is friendly and approachable, featuring eyes that sparkle with a hint of playfulness, suggesting it's not just a source of knowledge but also an engaging companion in the learning journey

Created by HeshamHaroon

Settings

"What is a large language model?"

"How do neural networks in large language models func..."

"Can you list some applications of large language model..."

Ask anything

Model: mistralai/Mixtral-8x7B-Instruct-v0.1 · Generated content may be inaccurate or false.



🔍 Search models, datasets, users...

Models

Datasets

Spaces

Posts

Docs

Solutions

Pricing

⋮



Hugging Face is way more fun with friends and colleagues! 🧑🏿‍🤝‍🧑🏿 [Join an organization](#)

Dismiss this message

mistralai **Mixtral-8x7B-v0.1**

🔗 Text Generation

🔖 Transformers

⚙️

Use a pipeline as a high-level helper

```
from transformers import pipeline
```

```
pipe = pipeline("text-generation", model="mistralai/Mixtral-8x7B-v0.1")
```

Load model directly

```
from transformers import AutoTokenizer, AutoModelForCausalLM
```

```
tokenizer = AutoTokenizer.from_pretrained("mistralai/Mixtral-8x7B-v0.1")  
model = AutoModelForCausalLM.from_pretrained("mistralai/Mixtral-8x7B-v0.1")
```

Quick Links

- 🔗 [Read model documentation](#)
- 🔗 [Read docs on high-level-pipeline](#)
- 🔗 [Read our learning resources](#)

Model Card for Mixtral-8x7B

The Mixtral-8x7B Large Language Model (LLM)

The Mistral-8x7B outperforms Llama 2 70B

For full details of this model please read our

Warning

This repo contains weights that are compatible with the [transformers](#) library. It is based on the original Mixtral [torrent release](#), but the file format and parameter names are different. Please note that model cannot (yet) be instantiated with HF.

Run the model

```
from transformers import AutoModelForCausalLM, AutoTokenizer  
  
model_id = "mistralai/Mixtral-8x7B-v0.1"  
tokenizer = AutoTokenizer.from_pretrained(model_id)
```

📄 Copy

📄 Copy

⌵

Deploy

🔗 Use in Transformers

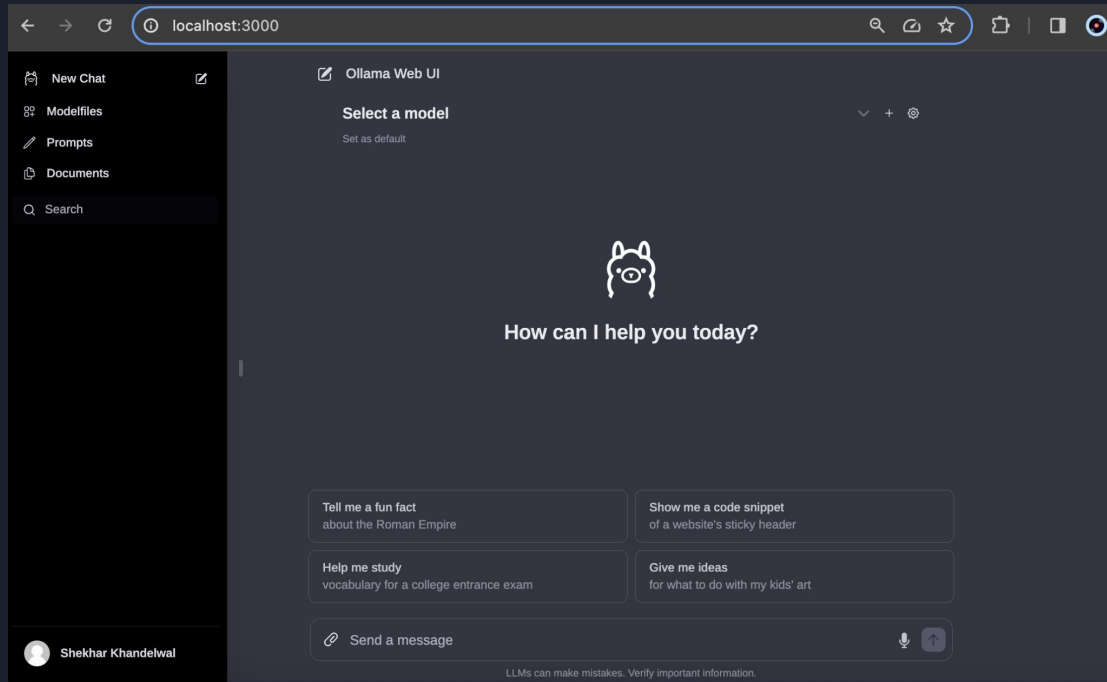
Tensor type **BF16** ➔

API. To try the model, launch it on [Inference](#)

Spaces using mistralai/Mixtral-8x7B-v0.1 204

- ✎ [ehristoforu/mixtral-46.7b-chat](#) 🧑🏿 [Tomoniai/Mixtral-Chat](#) 🧑🏿 [eson/tokenizer-arena](#)
- ✎ [Cenaashoori/Mixtral-Chat](#) 🧑🏿 [muhammeduran/TR-Chat-v1](#)
- ✎ [broadfield/Mixtral-Agent](#) 🧑🏿 [Statical/STC-LLM](#) 🧑🏿 [einfachalf/Einfach.Chat](#)
- ✎ [Agents_johann22/mixtral-test-46.7b-chat](#) 🧑🏿 [yhavinga/dutch-tokenizer-arena](#)
- ✎ [Nick088/Mixtral-46.7b-32k-Tokens](#) 🧑🏿 [uwj_johann22/mixtral-chat-selenium](#)
- ✎ [roshan8/mistralai-Mixtral-8x7B-v0.1](#) 🧑🏿 [Dariaaa5/Mixtral-Chat](#)
- ✎ [Dumitru94/mixtral-46.7b-chat](#) 🧑🏿 [officialhimanocha/SBS/LLama-factory](#)

The Local Chat GPT - Ollama



<https://medium.com/@khandelwal-shekhar/ollama-webui-a-revolutionary-llm-local-deployment-framework-with-chatgpt-like-web-interface-ec4a44b80102>

<https://medium.com/@khandelwal-shekhar/bring-any-huggingface-model-to-ollama-a457235dd5b8>

How to develop industry grade applications with LLMs ?



Disclaimer: All images are borrowed from web for better conceptual understanding.

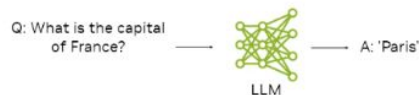
Prompt Engineering

Prompting Methodologies

Prompt design is crucial to obtaining good results from an LLM

Zero-Shot

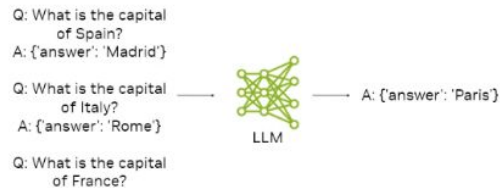
Asking the foundation model to perform a task with no in-prompt example



Lower token count
More space for context

Few-Shot

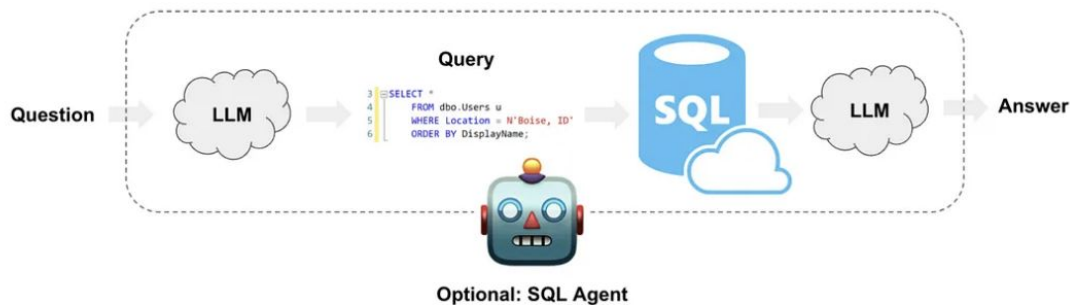
Providing examples as context to the foundation model related to a task



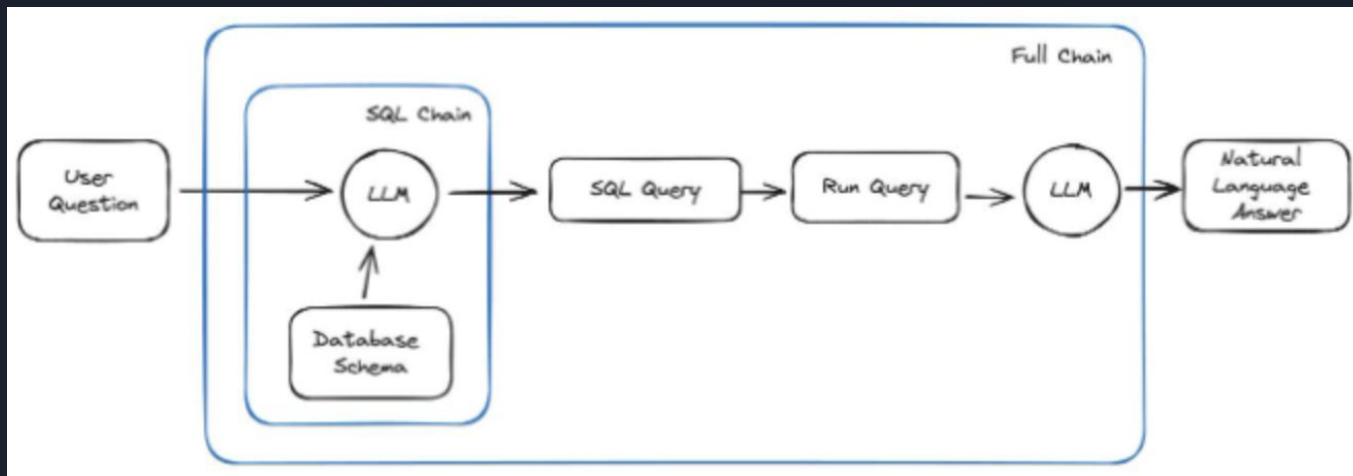
Better aligned responses
Higher accuracy on complex questions

Disclaimer: All images are borrowed from web for better conceptual understanding.

Talk to DB



Examples of using LLMs to generate SQL queries from user inputs, and summarize output to provide an answer. Sources: [Langchain SQL Agents](#)



Output Formatting

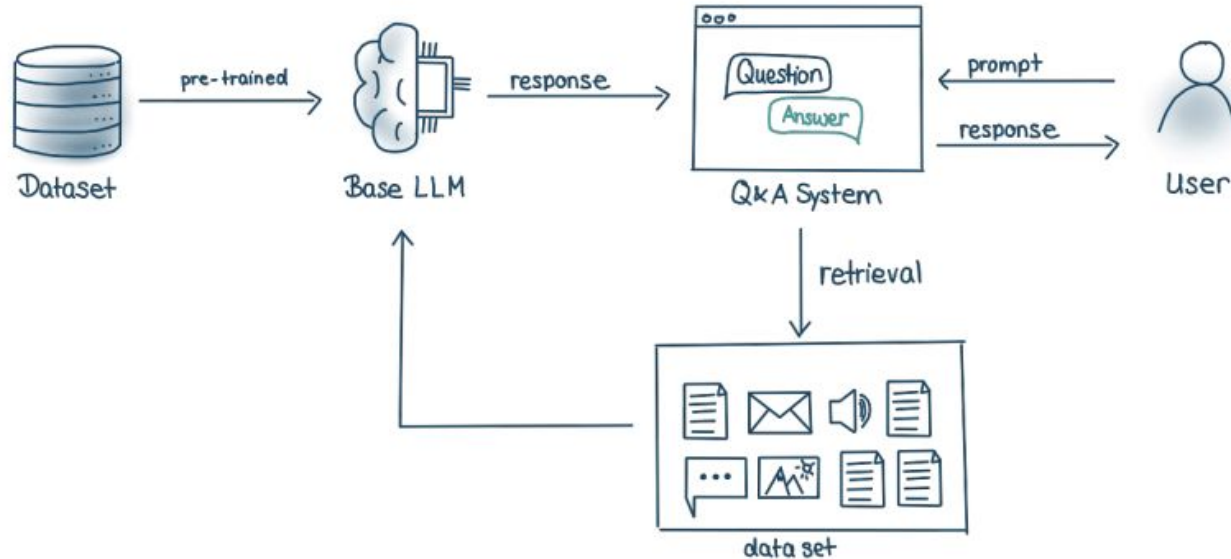
Pulling answers out of a response

- Your prompt can specify the output format
 - JSON
 - CSV
 - HTML
 - Markdown
 - Lists
 - Tables
 - YAML
 - Code
 - ... list is always growing
- Output received via API will typically be a string and require a conversion step for structured formats
 - But some APIs now ensure JSON object output
- Even high-end LLMs can produce imperfect formats — tuning can help, but also need error-checking

(7) Organize your answers into a JSON object with the following keys:
Customer Name, Product, Product Category, Summary, Tone, Response Urgency.

```
{  
  "Customer Name": "Zhiyong",  
  "Product": "CG Series Grand Piano",  
  "Product Category": "Acoustic Pianos",  
  "Summary": "Positive feedback and praise for the CG Series Grand Piano",  
  "Tone": "Positive",  
  "Response Urgency": "No Response Required"  
}
```

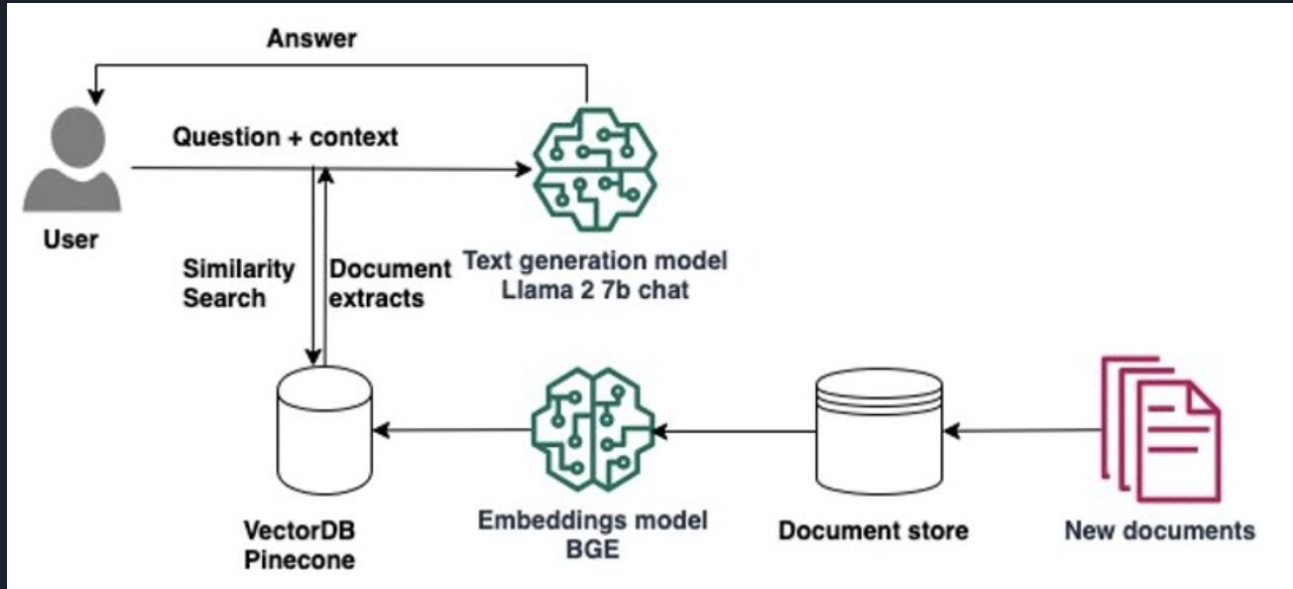
RAG - Retrieval Augmented Generation



Created by Julia Bastian & Sebastian Schuon

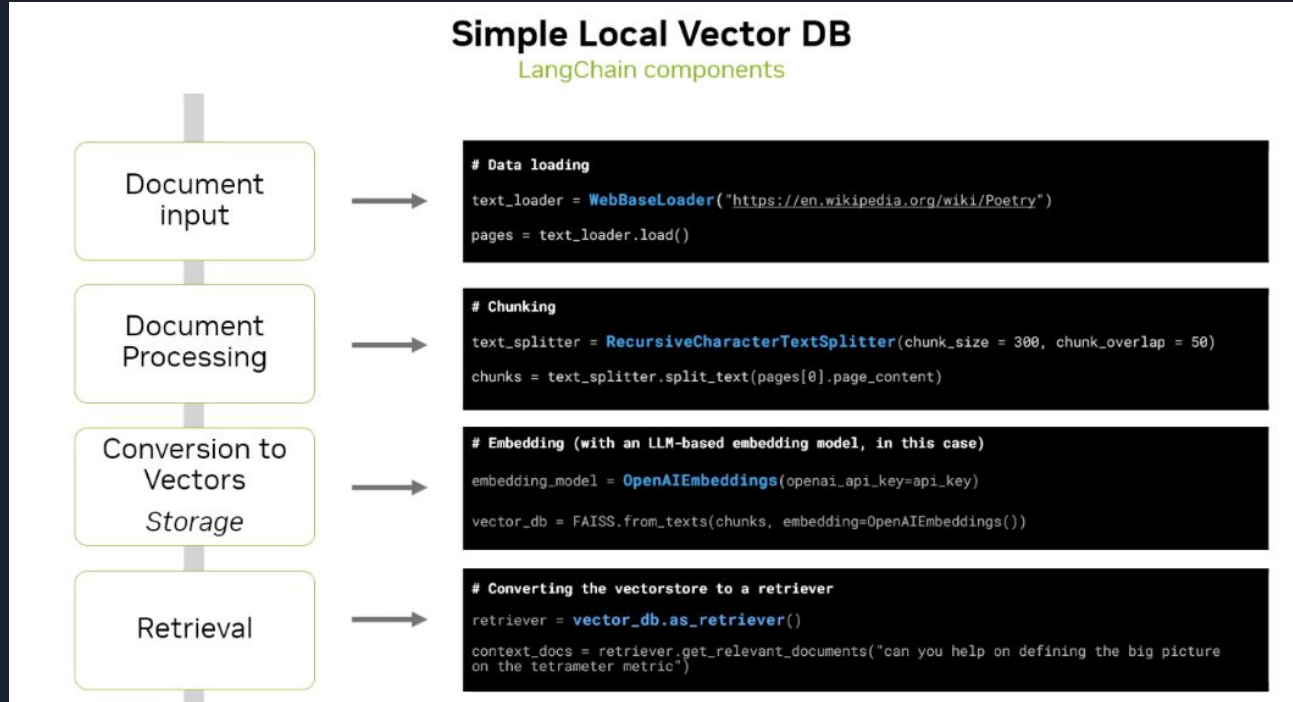
Disclaimer: All images are borrowed from web for better conceptual understanding.

RAG Technical Architecture



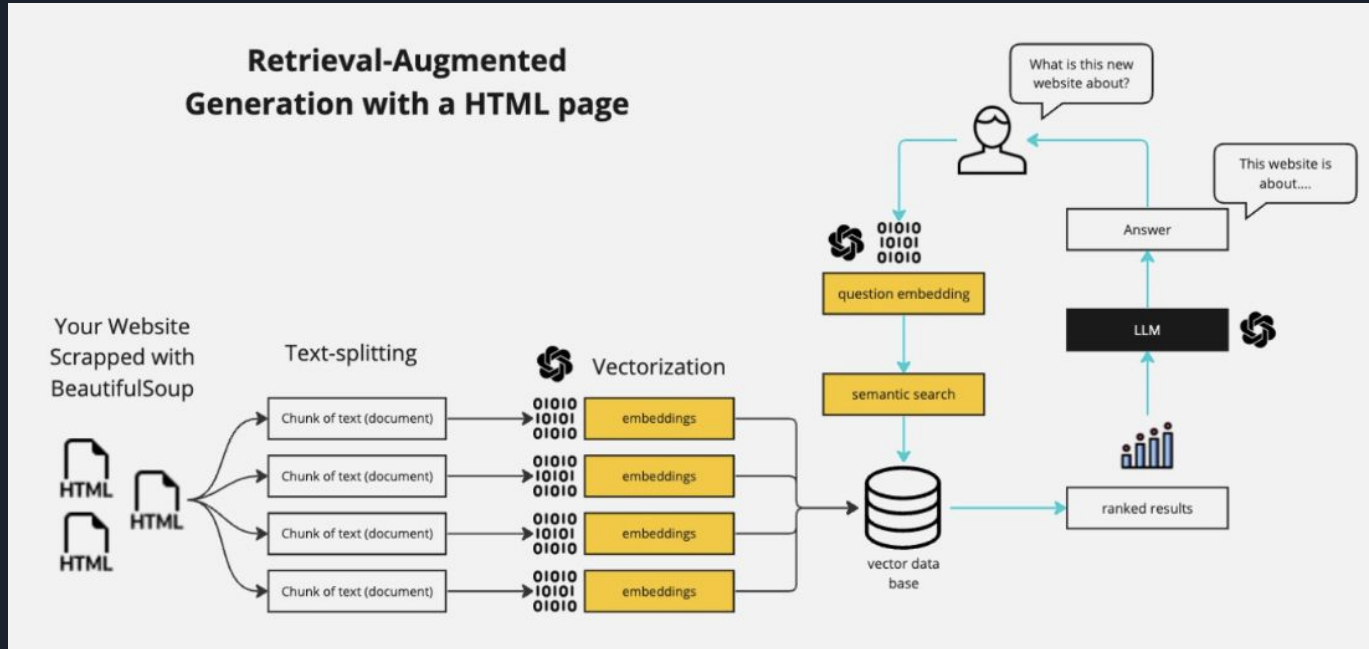
Disclaimer: All images are borrowed from web for better conceptual understanding.

RAG code



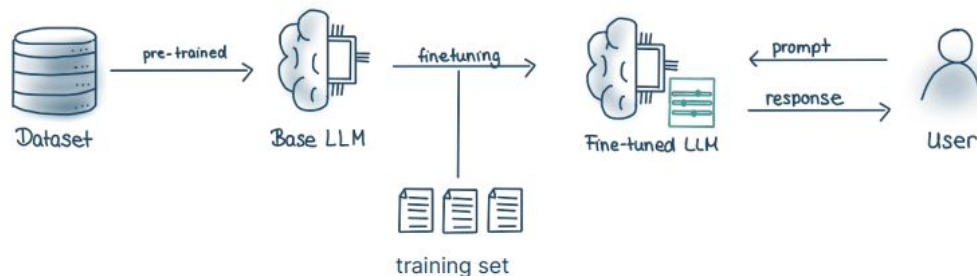
Disclaimer: All images are borrowed from web for better conceptual understanding.

Low Level RAG architecture



Disclaimer: All images are borrowed from web for better conceptual understanding.

Fine Tuning



Created by Julia Bastian & Sebastian Schuon

Acquire dataset
of complex
questions

Prompt Llama 2
70B with few-
shot prompts

Manually verify
results

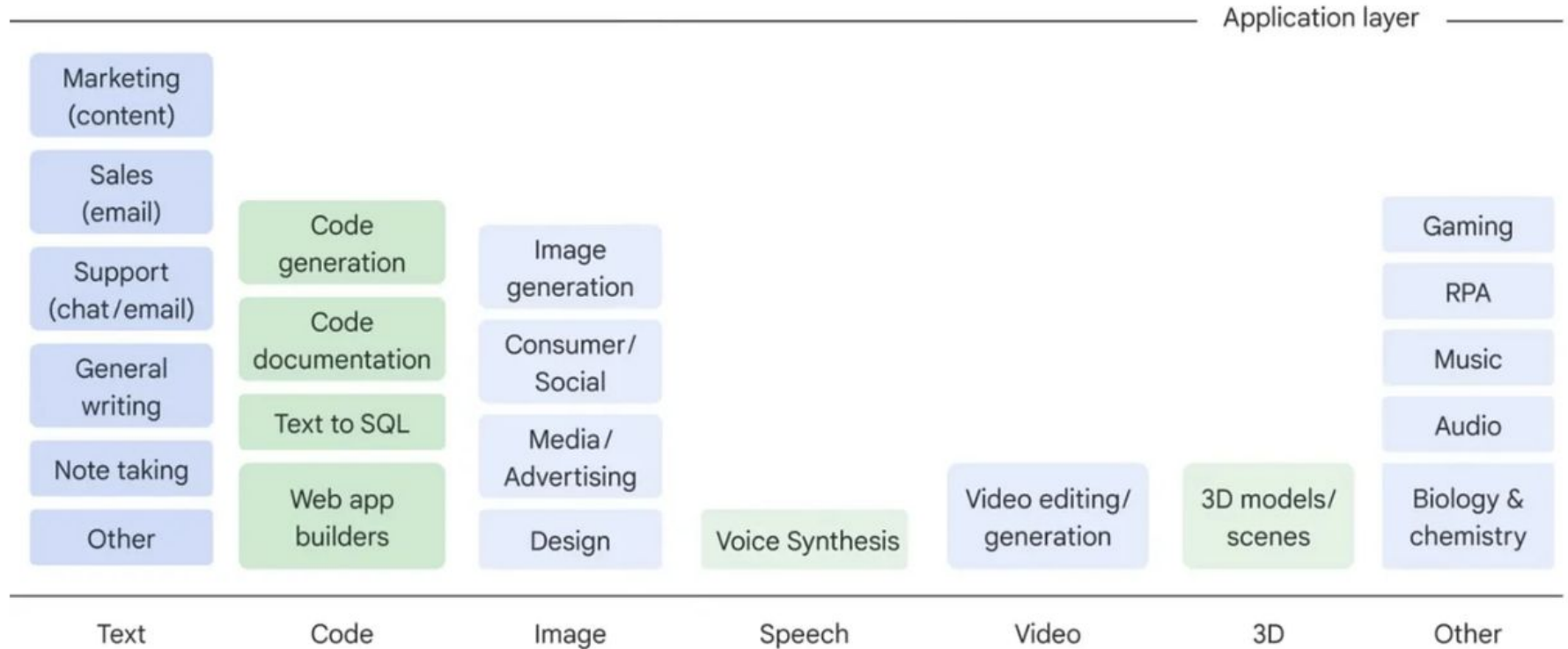
Train Llama 2 7B
with PEFT
(LoRA) and FP4
to mimic Llama
2 70B

Prompt Llama 2
7B with zero-
shot prompts.
Hosted on
OctoAI platform.

Agentic Applications



The Generative AI Application Landscape





Thanks !!