#### **Chapter 12 - Using APIs with Artificial Intelligence**

### The Overlap of AI and APIs

- Important Data Sources = API, Databases, Files
- How to inference a model? REST API.
- Most Als are cloud hosted and made available through APIs.
- Calling APIs directly from Generative AI application, like:
  - Retrieval Augmented Generation (RAG): calls APIs and other data sources and feeds the retrieved information to the LLM 
    ———
    Help to solve the Knowledge Gap problem in LLMs
- Generative AI application uses LLMs to determine what API endpoints to use: Agentic Application
  - The LLMs make decision by interpreting definitions from OAS files, Python code, or API documentation

#### Designing APIs to Use with Generative AI and LLMs

- Is your API endpoint appropriate to use with an agentic generative AI application without additional safeguard in place?
  - The Providers of LLMs provide warnings such as:
    - Anthropic Claude 3: LLM should not be used on their own in high-risk situations
    - Google NotebookLM: LLMs may sometimes provide inaccurate information
    - ChatGPT: Check important info
      - Solutions:
        - Requiring human to approve tasks recommended by LLMs before executing
        - Reviewing logs of the functioning of the system
        - Combining multiple Al agents to review tasks before executing
        - Reviewing and filtering inputs and outputs to the models
        - Foundational practices of API management and security are required when LLMs use APIs
          - Restrict the permissions provided to systems that include LLMs
- Limit the size of the data results:
  - Important for Cost and Accuracy:

- Cost perspective: Model providers charge for processing tokens (chunk of text) → more data a model processes = greater the cost
- Accuracy perspective: ChatGPT struggles to perform calculations from a very large datasets returned by APIs → limit size of the data = improves accuracy
  - Rather than returning all fields, return critical fields
  - add parameters, filters, pagination to narrow down the specific records in API call
- Make data structures consistent throughout the API:
  - More predictable API = More accurate AI
  - Re-using schemas inside API + defining them inside OAS file + use Pydantic (enforce schemas + publish them into OAS file)
- Provide a Software Development Kit (SDK):
  - Better endpoints + Customized API calls + Documentation
- Customize your OpenAPI Specification (OAS):
  - Endpoints in OAS file should have unique and clear operation IDs.
  - Customize OAS file with AI appropriate endpoints + detailed descriptions of each endpoint & its parameter that assist LLM in inferring their meanings
- Provide a separate endpoint for summary statistics:
  - Remove the guesswork of LLMs out
- Provide a search endpoint that doesn't rely on a record identifier:
  - LLMs are more comfortable with language than numbers

## **Arazzo to Define Multistep Processes**

- Because AI agents are nondeterministic  $\rightarrow$  difficult to ensure they use API correctly  $\xrightarrow{\mathrm{especially}} \text{ when you have multiple API calls } \xrightarrow{\mathrm{Solutions}} \text{ Add information to the descriptions}$  of each API endpoint in the OAS file or tool function  $\rightarrow$  Description Job = explain to AI model how one endpoint related to others  $\xrightarrow{\mathrm{Problem}}$  It is still up to AI model to use them correctly
- Other Solution = <u>Arazzo Specification</u>: sequences of calls and their dependencies  $\xrightarrow{\text{so}}$  you have a set of related calls  $\xrightarrow{\text{which means}}$  You have a deterministic building block  $\rightarrow$  add reliability to API usage

## **Defining Artificial Intelligence**

Artificial Intelligence is technology that enables computers and machines to simulate human learning, comprehension, problem solving, decision making, creativity and autonomy.

- Al is a computer program that can have humanlike conversations and complete humanlike tasks
  - Al include Expert System: Complicated rule-based systems that can perform human like tasks
  - Modern AI = Machine Learning, LLMs, Generative AI and etc.
    - Generative AI: have the ability to Generate text, music, and videos base on text prompts, like:
      - ChatGPT
      - Copilot
      - Gemini
    - Problems of Generative AI: warnings about bias, hallucinations, mistakes, harmful content

### **Creating Agentic Al Applications**

- Al agents are the forefront of Al research and development
- Agent is software that controls application flow using an LLM, the more autonomously the LLM controls the system, the more agentic the system is.
- Tools to Create Agent or Orchestrate multiple agent:

Autogen: Python, dotnet

CrewAI: Python

LangChain/LangGraph: PythonLlamaIndex: Python, Typescript

PydanticAI: Python

Vercel AI SDK: Typescript

# **Project Part III**

- Chapter 13: Deploying a Machine Learning API
- Chapter 14: Using APIs with LangChain
- Chapter 15: Using ChatGPT to call your API

# **Additional Resources:**

- Al and APIs What 12 Experts Think The Future Holds
- Syntax Sunday: Custom API Wrapper for GPTs
- What is the Model Context Protocol (MCP)? Model Context Protocol
- OpenTelemetry
- Is Your API Al-ready? Our Guidelines and Best Practices Guide | Blobr Copy
- Arazzo-Specification
- Nordic APIs