Semantic Spotter Project Submission

1. Background

This project demonstrates the implementation of a Retrieval-Augmented Generation (RAG) system tailored for the insurance domain, using the LangChain framework.

2. Problem Statement

The objective is to develop a reliable generative search engine capable of accurately answering user queries using insights from a collection of insurance policy documents.

3. Document Source

The insurance policy documents utilized in this project can be found in the designated Policy_Documents directory.

4. Approach

LangChain is an open-source framework designed to simplify the creation of LLM-powered applications. It offers a modular architecture for building complex systems quickly, supporting providers like OpenAI, Cohere, and Hugging Face.

Modular Components:

- LLM Interfaces
- Chains
- Retrievers
- Agents
- Memory
- Callbacks

It provides both low-level building blocks and pre-built chains to support rapid and robust development.

5. System Layers

5.1 PDF Parsing

Loads and processes PDFs via PyPDFDirectoryLoader.

5.2 Document Chunking

 ${\tt Uses} \ \ {\tt RecursiveCharacterTextSplitter} \ \ {\tt to} \ {\tt segment} \ {\tt text} \ {\tt into} \ {\tt semantically} \ {\tt meaningful} \ {\tt chunks}.$

5.3 Generating Embeddings

Embeddings are generated through OpenAIEmbeddings, enabling semantic search and comparisons.

5.4 Storing Embeddings

Stored in ChromaDB with CacheBackedEmbeddings for efficient retrieval.

5.5 Retrieval

Leverages VectorStoreRetriever to fetch relevant document chunks for user queries.

5.6 Re-Ranking

Improves relevance by re-scoring results with the HuggingFaceCrossEncoder model (BAAI/bge-reranker-base).

5.7 RAG Chain Workflow

Combines all components using a PromptTemplate and the rlm/rag-promp template from LangChain Hub to complete the RAG pipeline.

6. System Architecture

Architecture visuals can be found in the <code>images/</code> folder(arch1.png, arch2.png)

7. Prerequisites

- Python 3.7+
- langchain == 0.3.13
- OpenAl API key saved as OpenAI_API_Key.txt

8. Running the Project

- Clone the repo: git clone https://github.com/vikrampawar88/semantic-spotter-langchain-project.git
- $2. \ \, {\tt Open \ semantic-spotter-lang} chain-{\tt project.ipynb} \ \, {\tt in \ Jupyter}.$
- 3. Run all cells to build and test the pipeline.