RAG + Conversational Agent = Retrieval Chatbot with OpenAI

Conversational agents can struggle with data freshness, knowledge about specific domains, or accessing internal documentation.

"Naive" retrieval augmentation without the use of an agent is simply context retrieval via guery.

Merging these methods gives us the best of both worlds.

We start by doing a pip install of all required libraries.

```
!pip install -qU \
  transformers==4.31.0 \
  sentence-transformers==2.2.2 \
  pinecone-client==2.2.2 \
  datasets==2.14.0 \
  accelerate==0.21.0 \
  einops==0.6.1
  langchain==0.0.240 \
  xformers==0.0.20 \setminus
  bitsandbytes==0.41.0 \
  openai==0.28.1 \
  tiktoken==0.4.0
                                        7.4/7.4 MB 21.3 MB/s eta
0:00:00
                                         - 86.0/86.0 kB 9.7 MB/s eta
0:00:00
etadata (setup.py) ... •
179.1/179.1 kB 20.8 MB/s eta 0:00:00
                                        - 492.2/492.2 kB 39.6 MB/s eta
0:00:00
                                         - 244.2/244.2 kB 24.4 MB/s eta
0:00:00
                                         - 42.2/42.2 kB 4.5 MB/s eta
0:00:00
                                         - 1.4/1.4 MB 74.0 MB/s eta
0:00:00
                                         - 109.1/109.1 MB 14.8 MB/s eta
0:00:00
                                         - 92.6/92.6 MB 10.2 MB/s eta
0:00:00
                                         - 77.0/77.0 kB 7.3 MB/s eta
0:00:00
                                       — 1.7/1.7 MB 75.6 MB/s eta
0:00:00
```

0:00:00	7.8/7.8 MB 79.3 MB/s eta
0:00:00	1.3/1.3 MB 69.3 MB/s eta
0:00:00	62.5/62.5 kB 7.3 MB/s eta
0:00:00	300.4/300.4 kB 30.7 MB/s eta
0:00:00	115.3/115.3 kB 13.1 MB/s eta
0:00:00	134.8/134.8 kB 15.1 MB/s eta
0:00:00	48.2/48.2 kB 5.8 MB/s eta
0:00:00	90.0/90.0 kB 10.2 MB/s eta
0:00:00	619.9/619.9 MB 2.6 MB/s eta
0:00:00	21.0/21.0 MB 50.7 MB/s eta
0:00:00	849.3/849.3 kB 55.5 MB/s eta
0:00:00	11.8/11.8 MB 63.2 MB/s eta
0:00:00	557.1/557.1 MB 2.7 MB/s eta 317.1/317.1 MB 3.2 MB/s eta
0:00:00	168.4/168.4 MB 7.6 MB/s eta
0:00:00	54.6/54.6 MB 21.0 MB/s eta
0:00:00	102.6/102.6 MB 10.0 MB/s eta
0:00:00	173.2/173.2 MB 4.3 MB/s eta
0:00:00	177.1/177.1 MB 5.4 MB/s eta
0:00:00	98.6/98.6 kB 11.8 MB/s eta
0:00:00	63.3/63.3 MB 14.9 MB/s eta
0:00:00	153.0/153.0 kB 18.1 MB/s eta
0:00:00 ents to build wheel etadata (pyproje	ct.toml)
0:00:00	49.4/49.4 kB 5.4 MB/s eta
0:00:00	6.8/6.8 MB 25.6 MB/s eta

```
0:00:00

6.9/6.9 MB 25.5 MB/s eta
0:00:00

ers (setup.py) ... l) ... ERROR: pip's dependency resolver does not currently take into account all the packages that are installed. This behaviour is the source of the following dependency conflicts. llmx 0.0.15a0 requires cohere, which is not installed. torchaudio 2.1.0+cull8 requires torch==2.1.0, but you have torch 2.0.1 which is incompatible. torchdata 0.7.0 requires torch==2.1.0, but you have torch 2.0.1 which is incompatible. torchext 0.16.0 requires torch==2.1.0, but you have torch 2.0.1 which is incompatible.
```

Initialize the Embedding Model

```
from getpass import getpass
from langchain.embeddings.openai import OpenAIEmbeddings

OPENAI_API_KEY = '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'
model_name = 'text-embedding-ada-002'

embed = OpenAIEmbeddings(
    model=model_name,
    openai_api_key=OPENAI_API_KEY
)
```

Building the Vector Index

We now need to use the embedding pipeline to build our embeddings and store them in a Pinecone vector index. To begin we'll initialize our index, for this we'll need a free Pinecone API key.

```
import os
import pinecone
import pandas as pd
from google.colab import drive

PINECONE_API_KEY = '03355e6b-4a09-4d64-af35-f8ela9df0ac3'
PINECONE_ENV = 'gcp-starter'

# get API key from app.pinecone.io and environment from console
pinecone.init(
    api_key=PINECONE_API_KEY,
    environment= PINECONE_ENV
)
```

```
/usr/local/lib/python3.10/dist-packages/pinecone/index.py:4:
TqdmExperimentalWarning: Using `tqdm.autonotebook.tqdm` in notebook
mode. Use `tqdm.tqdm` instead to force console mode (e.g. in jupyter
console)
  from tgdm.autonotebook import tgdm
import time
index name = 'us-visas-db'
if index name not in pinecone.list indexes():
    pinecone.create index(
        index name,
        dimension=1536,
        metric='dotproduct'
    # wait for index to finish initialization
    while not pinecone.describe index(index name).status['ready']:
        time.sleep(1)
index = pinecone.Index('us-visas-db')
```

With our index and embedding process ready we can move onto the indexing process itself. For that, we need the dataset.

Part 1: CFR XML Files

```
# Load data from JSON Lines file to pandas DataFrame
drive.mount('/content/drive')
file path = '/content/drive/My Drive/Colab
Notebooks/Title-8/chunked/CFR xml.jsonl'
CFR = pd.read json(file path, lines=True)
Drive already mounted at /content/drive; to attempt to forcibly
remount, call drive.mount("/content/drive", force remount=True).
CFR.head()
                Source Section Subsection Chunk ID \
  CFR-2023-title8-vol1
                           sec1
1 CFR-2023-title8-vol1
                                        3
                                                  0
                           sec1
2 CFR-2023-title8-vol1
                                        2
                                                  0
                           sec1
3 CFR-2023-title8-vol1
                                                   0
                           sec1
                                        1
4 CFR-2023-title8-vol1
                                                   0
                         part1
                                               Text \
0 8 Aliens and Nationality 1 2023-01-01 2023-01-...
1 8 Aliens and Nationality 1 2023-01-01 2023-01-...
  8 Aliens and Nationality 1 2023-01-01 2023-01-...
3 8 Aliens and Nationality 1 2023-01-01 2023-01-...
4 8 Aliens and Nationality 1 2023-01-01 2023-01-...
```

```
Path
O /content/drive/My Drive/Colab Notebooks/Title-...
1 /content/drive/My Drive/Colab Notebooks/Title-...
2 /content/drive/My Drive/Colab Notebooks/Title-...
3 /content/drive/My Drive/Colab Notebooks/Title-...
4 /content/drive/My Drive/Colab Notebooks/Title-...
```

We will embed and index the documents like so:

```
from tqdm import tqdm
batch size = 64
for i in tqdm(range(0, len(CFR), batch_size)):
  i end = min(len(CFR), i + batch size)
  batch = CFR.iloc[i:i end]
  # Combine 'Source', 'Section', and 'Subsection' columns to create
unique identifiers
  ids = [f"{row['Source']} - {row['Section']} - {row['Subsection']} -
{row['Chunk ID']}" for _, row in batch.iterrows()]
  texts = batch['Text'].tolist()
  # Assuming you have an embed model initialized
  embeds = embed.embed documents(texts)
  # Get metadata to store in Pinecone
  metadata = [
    {
      'text': row['Text'],
      'Filepath': row['Path'],
      'Source': row['Source'],
      'Section': row['Section'],
      'Subsection': row['Subsection'],
      'Chunk ID' : row['Chunk ID']
    for _, row in batch.iterrows()
  # Add to Pinecone
  index.upsert(vectors=list(zip(ids, embeds, metadata)))
      | 28/28 [00:45<00:00, 1.61s/it]
index.describe_index stats()
{'dimension': 1536,
 'index fullness': 0.01599,
```

```
'namespaces': {'': {'vector_count': 1599}},
'total_vector_count': 1599}
```

Part 2: FAM09 HTML Files

```
# Load data from JSON Lines file to pandas DataFrame
file path FAM09 = '/content/drive/My Drive/Colab
Notebooks/Title-8/chunked/FAM09 html.jsonl'
FAM09 = pd.read json(file path FAM09, lines=True)
FAM09.head()
  Source Section ID Subsection ID Chunk ID \
  09FAM
               0101
                               01
               0101
                               02
                                          0
1
  09FAM
  09FAM
               0102
                               01
                                          0
3 09FAM
                                          1
               0102
                               01
4 09FAM
               0102
                               01
                                          2
                                                Text \
  9 FAM 101.1 INTRODUCTION TO 9 FAM UNCLASSIFIED...
  9 FAM 101.2 TRAINING AND SUPPORT FOR 9 FAM USE...
1
  9 FAM 102.1 INTRODUCTION TO VISAS (WHAT IS A V...
  Sources (CT:VISA-1; 👀 11-18-2015) A.C.S.A. 41....
4 sea carrier (airlines or cruise ships), their ...
                                                Path
  /content/drive/My Drive/Colab Notebooks/Title-...
  /content/drive/My Drive/Colab Notebooks/Title-...
2 /content/drive/My Drive/Colab Notebooks/Title-...
  /content/drive/My Drive/Colab Notebooks/Title-...
4 /content/drive/My Drive/Colab Notebooks/Title-...
from tqdm import tqdm
batch size = 16
batch size upsert = 80 # Set your desired batch size for upsert
rate limit delay = 60 / (2* 150000) # Delay to stay within the
150,000 tokens per minute limit
for i in tqdm(range(0, len(FAM09), batch_size)):
  i \text{ end } FAM09 = \min(len(FAM09), i + batch size)
  batch FAM09 = FAM09.iloc[i:i end FAM09]
  # Combine 'Source', 'Section', and 'Subsection' columns to create
unique identifiers
  ids FAM09 = [f"{row['Source']} - {row['Section ID']} -
{row['Subsection ID']} - {row['Chunk ID']}" for _, row in
batch FAM09.iterrows()]
  texts FAM09 = batch FAM09['Text'].tolist()
```

```
# Assuming you have an embed model initialized
  embed FAM09 = embed.embed documents(texts FAM09)
 # Get metadata to store in Pinecone
  metadata FAM09 = [
    {
      'text': row['Text'],
      'Filepath': row['Path'],
      'Source': row['Source'],
      'Section': row['Section ID'],
      'Subsection': row['Subsection ID'],
      'Chunk ID' : row['Chunk ID']
   for _, row in batch_FAM09.iterrows()
  # Zip vectors and metadata
  vectors metadata chunk = list(zip(ids FAM09, embed FAM09,
metadata FAM09))
 # Upsert in batches
  batch size upsert = 100 # Set your desired batch size for upsert
  for start in range(0, len(vectors metadata chunk),
batch size upsert):
    end = min(start + batch size upsert, len(vectors metadata chunk))
    chunk to upsert = vectors metadata chunk[start:end]
    # Add to Pinecone
    index.upsert(vectors=chunk to upsert)
    # Introduce a delay to stay within the rate limit
    time.sleep(rate limit delay)
      | 76/76 [01:07<00:00, 1.13it/s]
100%|
index.describe_index_stats()
{'dimension': 1536,
 'index fullness': 0.02954,
 'namespaces': {'': {'vector_count': 2954}},
 'total vector count': 2954}
```

Creating a Vector Store and Querying

```
from langchain.vectorstores import Pinecone

text_field = "text"

# switch back to normal index for langchain
```

```
index = pinecone.Index(index_name)

vectorstore = Pinecone(
    index, embed.embed_query, text_field
)
```

We can use the similarity_search method to do a pure semantic search (without the generation component).

```
query = "Who is qualified to obtain a H-1B visa?"
vectorstore.similarity search(
    query, # our search query
    k=3 # return 3 most relevant docs
[Document(page_content='Nonimmigrants (CT:VISA-1623; № 09-29-2022) a.
(U) The H-1B classification\napplies to an applicant who is coming
temporarily to the United States to\nperform services in one of the
categories described below. For information on\nH-1B1 classification
for nationals of Chile and Singapore deriving from free\ntrade
agreements see 9 FAM\n402.10-5 below. (1) (U) Applicants\nin
Specialty Occupations: @ Applicants who are qualified to perform
nservices in a specialty occupation as described in INA 214(i)(1) and
(2) (other\nthan agricultural workers, described in INA 101(a)(15)(H)
(ii)(A) or applicants\nqualifying under INA 101(a)(15)(0) or (P)) are
classifiable as H-1B\nnonimmigrants. (a) (U) A specialty occupation\
nrequires the attainment of a bachelor's or higher degree in the
specific\nspecialty (or its equivalent) for entry into the
occupation. An applicant\nseeking to work in a specialty occupation
must have completed such a degree or\nhave experience in the specialty
equivalent to the completion of the degree (as\ndetermined by USCIS)
and expertise in the specialty through progressively\nresponsible
positions relating to the specialty. (b) ② (U) The criteria for\
nqualifying as an H-1B physician are found in subparagraph 3 below.
(c)♥ (U) Before filing a petition\nwith USCIS on behalf of an
individual in a\nspecialty occupation, the petitioner must have
obtained a certification from\nDOL that it has filed a labor condition
application (LCA) as specified in INA\n212(n)(1). The filing of an
LCA does not constitute a determination that the\noccupation in
question is a specialty occupation. USCIS is responsible for
determining whether the\napplication involves a specialty occupation
and whether the individual for whom\nH-1B status is sought qualifies
to perform services in that occupation. (2) (U) Certain\nFashion
Models: ♥ H-1B classification may be granted to an applicant who\nis
of distinguished merit and ability in the field of fashion modeling. ②\
n"Distinguished merit and ability" is defined by USCIS as prominence;
i.e., the attainment of a high\nlevel of achievement in the field of
fashion modeling evidenced by a degree of\nskill and recognition
```

substantially above that ordinarily encountered to the\nextent that a person described as prominent is renowned, leading, or well-known\nin the field. Such an applicant must also be coming to the United States to\nperform services which require a fashion model of prominence. The petitioner\nof a fashion model of distinguished merit and ability must file an LCA (see 9 FAM 402.10-6 below) with DOL\nbefore filing a petition for the applicant. (3)@ (U) Physicians: (a)@ (U) Graduates\ nof Foreign or U.S. Medical Schools: 👀 A foreign "graduate of a nmedical school," as defined in INA 101(a)(41), may enter the United States\nas an H-1B nonimmigrant to perform services as a member of the medical\nprofession if they have a full and unrestricted license to practice medicine in\na foreign state or if they have graduated from medical school in either the\nUnited States or in a foreign state. In addition, if they will provide direct\npatient care, they must generally have a valid medical license in the state of\nintended employment; however, USCIS may grant a limited-validity petition to\ nallow the beneficiary time to obtain a professional license. An individual\ninvolved in a medical residency program, for example, may have an approved H-1B\npetition, even though they do not yet have a full and unrestricted U.S. medical\nlicense. (b) (U) Coming\nto Teach or Conduct Research: 🚱 A foreign physician may also be\nclassified as an H-1B nonimmigrant if they are coming to the United States\ nprimarily to teach or conduct research, or both, at or for a public or nonprofit\nprivate educational or research institution or agency. Such an applicant may\nonly engage in direct patient care that is incidental to their teaching and/or\nresearch. (c)@ (U) Applicant\ nPhysicians Not Eligible for H-2B or H-3 Classification: **②** Foreign \ nphysicians who are coming to the United States to perform medical services or\nreceive graduate medical training are statutorily ineligible to receive H-2B or\nH-3 status. (4) (U) Applicants\nin Department of Defense Cooperative Research and\nDevelopment or Coproduction Projects: Applicants coming to the United\nStates, pursuant to INA 222, to participate in a cooperative research and', metadata={'Chunk ID': 1.0, 'Filepath': '/content/drive/My Drive/Colab Notebooks/Title-8/FAM state gov downloads/09FAM040210.html', 'Section': '0402', 'Source': '09FAM', 'Subsection': '10'}), Document(page content="Only principals are counted against each country's respective numerical\nlimitation. Initial applications for H-1B1 classification are counted against\nthe H-1B1 annual numerical limitations, as is each renewed labor condition\napplication (LCA). b. (U) At the end of each\nfiscal year, unused H-1B1 numbers will be returned to that year's total\nH-1B global numerical limit and will be made available to H-1B applicants\nduring the first 45 days of the new fiscal year. c. (U) USCIS is required to keep a numerical count of the\nH-1B1 visas issued. The Office of Visa Services (CA/VO) monitors the number\nused based on workload data. © On a periodic basis, CA/VO provides this\ninformation to USCIS. 9 FAM 402.10-5(C) @(U)\ nApplicants Subject to Labor Condition (CT:VISA-1846; 🕪 10-05-2023) (U) Employers must submit a labor\ncondition application (LCA) for

foreign workers of Chilean or Singaporean\nnationality under the H-1B1 program. ♥ If the employee applies for an H-1B1 visa\nabroad, rather than adjusting status with USCIS, the law requires DOL to\ncertify to the Department that Form ETA-9035, Labor Condition Application for\nH-1B Nonimmigrants, has been filed with DOL. If certified, the employer\ntransmits a copy of the signed, certified LCA to the applicant together with a\nwritten offer of employment. The applicant will present a certified copy of\nthe LCA, clearly annotated by the employer as "H-1B1 Chile" or\n"H-1B1 Singapore," as proof of filing with the visa application. 9 FAM 402.10-5(D) ♥(U) No\nPetition Required (CT:VISA-1846; 00 10-05-2023) (U) An employer of an H-1B1\ nprofessional is not required to file a petition with USCIS. Instead, an\nemployee will present evidence for classification directly to you with the visa\napplication. 9 FAM 402.10-5(E) @(U) H-1B1 Professionals\nin Specialty Occupations (CT:VISA-1623; 00 09-29-2022) a. (U) The H-1B1 category\nallows for the entry of nonimmigrant professionals in "specialty\noccupations." The definition of "specialty occupation" set\nforth in both FTAs is presently identical to the regulatory definition for\nH-1Bs; i.e., an occupation that requires: (1) (U) Theoretical and\npractical application of a body of specialized knowledge; and (2)@ (U) Attainment of a\nbachelor's or higher degree in the specific specialty (or its equivalent)\nas a minimum for entry into the occupation in the United States" (8 CFR\ n214.2). You Oshould refer to this section for quidance in connection with an\napplicant's qualifications as an H-1B1 professional. b. (U) Both agreements allow\nfor alternative credentials for certain professions. The United States has\nagreed to accept alternative credentials for Chilean and Singaporean nationals\nin the occupations of Disaster Relief Claims Adjuster and Management Consultant. •\ nDisaster Relief Claims Adjusters must have a baccalaureate degree, Licenciatura\ndegree, or Titulo Profesional and completion of training in the appropriate\nareas of insurance adjustment pertaining to disaster relief claims or three\nyears' experience in claims adjustment and successful completion of training in\nthe appropriate areas of insurance adjustment pertaining to disaster relief\nclaims. Management Consultants must have a baccalaureate degree, Licenciatura ndegree, or Titulo Profesional, even if in an unrelated discipline. If a\nManagement Consultant has a degree in an unrelated discipline, the applicant additionally\nmust have 3 years of experience in a field or specialty related to the \nconsulting agreement. For Chilean nationals only, Agricultural Managers and \nPhysical Therapists can also qualify with a combination of a post-secondary\ncertificate requiring three years of study in the specialty and three years'\nexperience in lieu of the standard degree requirements. Vou may accept\nspecified documentary evidence of alternative credentials. 9 FAM 402.10-5(F) �(U)\nTemporary Entry of FTA Professionals (CT:VISA-1846; ♠♠ 10-05-2023) a. (U) Both agreements provide\nfor the temporary entry of professionals into the United States. Temporary\nentry is defined in both agreements as "an entry into the United States\nwithout the

```
intent to establish permanent residence." You must be
metadata={'Chunk ID': 6.0, 'Filepath': '/content/drive/My Drive/Colab
Notebooks/Title-8/FAM state gov downloads/09FAM040210.html',
'Section': '0402', 'Source': '09FAM', 'Subsection': '10'}),
Document(page content="physicians who are coming to the United States
to perform medical services or\nreceive graduate medical training are
statutorily ineligible to receive H-2B or\nH-3 status. (4) (4)
Applicants\nin Department of Defense Cooperative Research and\
nDevelopment or Co-production Projects: Applicants coming to the
United\nStates, pursuant to INA 222, to participate in a cooperative
research and\ndevelopment project or a co-production project under a
government-to-government\nagreement administered by DOD are
classifiable as H-1B nonimmigrants. Such applicants\nmust perform
services of an exceptional nature requiring exceptional merit and\
nability. For purposes of this classification, services of an
exceptional\nnature must be those which require a bachelor's degree or
higher (or its\nequivalent, as determined by USCIS) to perform the
duties. The requirement for\nfiling an LCA with DOL does not apply to
petitions involving DOD cooperative\nresearch and development or co-
production projects. b. (U) General\nLicensure Requirement: @ The
requirements for classification as an H-1B\nnonimmigrant professional
may or may not include a license because states have\ndifferent rules
in this area.♥ If a state permits applicants to take a\nlicensing exam
while in nonimmigrant status, then USCIS will generally require\na
license before they will approve the H-1B petition. However, some
states do\nnot permit applicants to take licensing exams until they
enter the United\nStates in H-1B status and obtain a taxpayer
identification number. Therefore, \na visa must not be denied based
solely on the fact that the applicant does not\nalready hold a license
to practice in the United States if the applicant\nintends to work in
a state that requires a taxpayer identification number as a\
nprerequisite to licensure. 9 FAM 402.10-4(C) Q(U) H-1CQ\nNurse in
Health Professional Shortage Area (CT:VISA-1474; 🚱 02-17-2022) (U)
This classification expired as\nof December 20, 2009. 9 FAM 402.10-
4(D) Q(U) H-2A\nNonimmigrants (CT:VISA-1623; QQ 09-29-2022) a. (U) The
H-2A classification\napplies to applicants who are coming temporarily
to the United States to\nperform agricultural work of a temporary or
seasonal nature. b. (U) The petitioner must file\na temporary
agricultural labor certification with DOL before filing a petition
nwith USCIS to classify a beneficiary as an\nH-2A nonimmigrant. c.@
(U) Except as noted in 9 FAM 402.10-7(C) below,\nUSCIS generally may
only approve a Form\nI-129, Petition for a Nonimmigrant Worker, filed
on behalf of an H-2A worker\nwho is a national of a country designated
as an H-2A program eligible country.\nHowever, USCIS may still approve
H-2A\npetitions filed for nationals of countries not designated as
participating\ncountries, if such an approval is in the U.S. interest,
as noted in 9 FAM 402.10-7 (C paragraph c,\nbelow. (1) (U) The
designated\ncountries can be found on the USCIS H-2A website. (2) (U)
Countries are\ndesignated as H-2A program participating countries
```

based on factors that\ninclude the following: (a) (U) The country's\ ncooperation with respect to the issuance of travel documents for citizens,\nsubjects, nationals, and residents of that country who are subject to a final\norder of removal from the United States; (b)@ (U) The number of final and\nunexecuted orders of removal against citizens, subjects, nationals, and\nresidents of that country; (c) (U) The number of orders of\nremoval executed against citizens, subjects, nationals, and residents of that\ncountry; and (d)♥ (U) Such other factors as\nmay serve U.S. interest. (3) (U) Posts will be advised\nwhen there are changes to the list of participating countries as well as the\neffective dates for their formal participation in the program. Designations\nwill be valid for one year from the date of publication of the list of eligible\ncountries in the Federal Register. © On a case-by-case basis, DHS may allow a\nworker from a country not on the participating country list to be eligible for\nthe H-2A program if, among other considerations, such participation is in the\ninterest of the United States. (4)@ (U) Posts recommending\nthat a country obtain, maintain, or lose status as an H-2A program participant", metadata={'Chunk ID': 2.0, 'Filepath': /content/drive/My Drive/Colab Notebooks/Title-8/FAM state gov downloads/09FAM040210.html', 'Section': '0402', 'Source': '09FAM', 'Subsection': '10'})]

Building the Chatbot

LangChain library will provide the framework to bring various components together for our chatbot. Component 2: Initializing a ChatOpenAI object with OpenAI API key for naive chatbot.

```
from langchain.chat_models import ChatOpenAI

chat = ChatOpenAI(
    openai_api_key=OPENAI_API_KEY,
    model='gpt-3.5-turbo-16k'
)

from langchain.schema import (
    SystemMessage,
    HumanMessage,
    AIMessage
)

messages = [
    SystemMessage(content="You are a helpful assistant."),
    HumanMessage(content="Hi AI, how are you today?"),
    AIMessage(content="I'm great thank you. How can I help you?"),
]
```

Retrieval Augmented Generation

Now utilizing our developed knowledge base, it's time to connect the knowledge base to the chatbot.

```
def augment prompt(query: str):
    # get top 3 results from knowledge base
    results = vectorstore.similarity search(query, k=5)
    # get the text from the results
    source knowledge = "\n".join([x.page content for x in results])
    # feed into an augmented prompt
    augmented prompt = f"""You are an assistant helping the user
understand about the USA's nonimmigrant visa laws and processes.
Please answer the query using the provided contexts below.
    If an answer is contingent on various factors, please list all of
those factors for the user to consider. If it is unclear whether or
not the user has considered a factor, ask the user for clarity.
    Contexts:
    {source knowledge}
    Query: {query}"""
    return augmented prompt
print(augment prompt("Can you provide a summary of all the inputs
required to fill out a I-94 form?"))
Please answer the guery using the provided contexts below.
    The assistant is helpful and asks follow up questions whenever
possible to make that all various factors are considered by the user.
    If an answer is contingent on various factors, please provide a
comprehensive list of these factors to the user, then ask them if they
have met all the criteria.
    Contexts:
    8 Aliens and Nationality 1 2023-01-01 2023-01-01 false Definition
of Form I-94 1.4 Section 1.4
             Aliens and Nationality DEPARTMENT OF HOMELAND SECURITY
GENERAL PROVISIONS DEFINITIONS
         § 1.4 Definition of Form I−94
            The term
             Form I-94, Form I-94, (a) The terms "annotate," "note,"
"indicate on," "stamp," and "endorse," unless used in part 231 of this
chapter, include, but are not limited, to DHS amending, including or
completing information in its electronic record of admission, or
arrival/departure. For purposes of part 231, the term "endorse"
includes but is not limited to the submission of electronic departure
```

data to CBP. (b) The terms "completed," "completely executed" and "completed and signed" include, but are not limited to, DHS completing its collection of information into its electronic record of admission, or arrival/departure. (c) The terms "issuance" and "given" include, but are not limited to, the creation of an electronic record of admission, or arrival/departure by DHS following an inspection performed by an immigration officer. (d) The term "original I-94" includes, but is not limited to, any printout or electronic transmission of information from DHS systems containing the electronic record of admission or arrival/departure. (e) The terms "present," "presentation," or "submission" of a Form I-94, unless they are used in § 231.1 or § 231.2 of this chapter, include, but are not limited to, providing a printout of information from DHS systems containing an electronic record of admission or arrival/departure. For purposes of § 231.1 of this chapter, the terms "present" or "submission" of the Form I-94 includes ensuring that each passenger presents him/herself to a CBP Officer for inspection at a U.S. port-of-entry. For the purposes of § 231.2 of this chapter, the terms "present," "submit," or "submission" of the Form I—94 includes ensuring that each passenger is available for inspection by a CBP Officer upon request. (f) The term "possession" with respect to a Form I-94 includes, but is not limited to, obtaining a copy or printout of the record of an electronic evidence of admission or arrival/departure from the appropriate CBP systems. (g) The terms "surrendering," "turning in a Form I-94," and "departure I-94" includes, but is not limited to, complying with any departure controls under 8 CFR part 215 that may be prescribed by CBP in addition to the submission of electronic departure data to CBP by a carrier. [78 FR 18472, Mar. 27, 2013]

(vii) Aliens who are the spouse or child of a United States citizen whose visa petition has been approved and

(5) Applicants for asylum under section 208(a) of the Act and applicants for withholding of removal under section 241(b)(3) of the Act or under the Convention Against Torture who have been granted employment authorization, and such applicants under the age of 14 who have had an application pending for at least 180 days.

(b)

Non-issuance of a Notice to Appear and nonenforcement of deportation, exclusion, or removal orders. (1) Issue a Notice to Appear; or (2) Enforce an outstanding order of deportation, exclusion or removal.

§ 1.4 Definition of Form I—94

The term

Form I—94, Form I—94, (a) The terms "annotate," "note," "indicate on," "stamp," and "endorse," unless used in part 231 of this chapter, include, but are not limited, to DHS amending, including or completing information in its electronic record of admission, or arrival/departure. For purposes of part 231, the term "endorse" includes but is not limited to the submission of electronic departure data to CBP. (b) The terms "completed," "completely

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executed" and "completed and signed" include, but are not limited to,
DHS completing its collection of information into its electronic
record of admission, or arrival/departure. (c) The terms "issuance"
and "given" include, but are not limited to, the creation of an
electronic record of admission, or arrival/departure by DHS following
an inspection performed by an immigration officer. (d) The term
"original I—94" includes, but is not limited to, any printout or
electronic transmission of information from DHS systems containing the
electronic record of admission or arrival/departure. (e) The terms
"present," "presentation," or "submission" of a Form I-94, unless they
are used in § 231.1 or § 231.2 of this chapter, include, but are not
limited to, providing a printout of information from DHS systems
containing an electronic record of admission or arrival/departure. For
purposes of § 231.1 of this chapter, the terms "present" or
"submission" of the Form I—94 includes ensuring that each passenger
presents him/herself to a CBP Officer for inspection at a U.S. port-
of-entry. For the purposes of § 231.2 of this chapter, the terms
"present," "submit," or "submission" of the Form I-94 includes
ensuring that each passenger is available for inspection by a CBP
Officer upon request. (f) The term "possession" with respect to a Form
I-94 includes, but is not limited to, obtaining a copy or printout of
the record of an electronic evidence of admission or arrival/departure
from the appropriate CBP systems. (g) The terms "surrendering,"
"turning in a Form I-94," and "departure I-94" includes, but is not
limited to, complying with any departure controls under 8 CFR part 215
that may be prescribed by CBP in addition to the submission of
electronic departure data to CBP by a carrier. [78 FR 18472, Mar. 27,
20131
requirements in this IV DV Passport Waiver template: (1) Applicant's
full name with all aliases; (2) Date and place of birth; (3)
Nationality; (4) Flight itinerary including the date and port of
expected arrival in the United States; please include the flight
reservation as
an attachment in the email if you have it. (If the POE is
undetermined, please
submit a tentative itinerary with the tentative POE and travel
itinerary. © CBP
will not consider the passport waiver request without a POE as it is
up to the
POE to accept or reject the passport waiver request); (5)  Immigrant
classification; (6) Documents to be waived; (7) A summary of the of
the emergent circumstances
surrounding the case which must include information indicating that
all the
requirements of the subparagraph of 22 CFR 42.2(g) under which the
waiver is
recommended have been met; (8) Name, address, and telephone number of
the person
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where the applicant intends to reside in the United States. b.

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Officers must notify the designated CA/VO/F liaison
with any itinerary changes. If the applicant's itinerary changes to a
different POE a new waiver of passport request must be submitted. © CBP
P<sub>0</sub>E
concurrence is granted by the Port Director at the POE, therefore a
new request
must be submitted. UNCLASSIFIED (U)
information sheets to CA/VO/F/IE. # Although
you do not have to receive prior approval to use a nonstandard
information
sheet, VO wants information sheets to be
coordinated and consolidated in the interests of efficiency.
Therefore, you must send copies of all new nonstandard forms to
NVCPost@state.gov. b. (U) Do not translate forms used
in the IV process into the local language.  You may prepare a local
language
information sheet explaining the forms. 9 FAM 504.4-4 🕏 (U) Supporting
Documents 9 FAM 504.4-4(A) (U) Basic
Document Requirements (CT:VISA-1864; 🚱 11-16-2023) a. (U) An applicant
applving
for an IV must follow all instructions on travel.state.gov for
submitting the
following documents, if available: (1) (U) Birth Certificates: The
applicant must obtain an original or certified copy of their birth
certificate
and those of any family member immigrating with the applicant. (2)
(U) Court and Prison Records: ② If
the applicant has ever been convicted of a crime, they must obtain an
original
or certified copy of each court and prison record, even if later
granted
amnesty, a pardon, or other act of clemency. (3) (U) Marriage
Records: (a) (U) Marriage Certificates: If
the applicant is or has been married, they must obtain an original or
certified
copy of the marriage certificate of every marriage. (b) (U) Marriage
Termination: If
the applicant was previously married, they must obtain evidence of the
termination of every prior marriage. The evidence must be an original
certified copy of a final legal divorce decree, death certificate, or
annulment
papers. (4)(4)(U) Military Records: (1) If
the applicant has ever served in the military of any country, they
must obtain
an original or certified copy of their military record. (5) (U)
Petitioner Documents: (a) (a) (U) If the applicant is
applying for an IR5 or an F4 visa, they must obtain an original or
certified
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copy of the petitioner's birth certificate. (b) (U) If the applicant
İS
applying for an IR1, CR1, or F2A visa as the spouse of a U.S. citizen
and the petitioning spouse was previously married, they must provide
evidence
of the termination of every prior marriage of the petitioning spouse.
The
evidence must be an original or certified copy of a final legal
divorce decree,
death certificate, or annulment papers. (c) (c) (U) If the applicant is
stepchild and is applying for an IR2, CR2, F2, or any other visa
classification
requiring that the applicant be a child, they must obtain an original
certified copy of the marriage certificate of every marriage of the
petitioner and
the applicant's natural parent. If the petitioner or applicant's
natural parent was previously married, the applicant must obtain
evidence of
the termination of every prior marriage. The evidence must be an
original or
certified copy of a final legal divorce decree, death certificate, or
annulment
papers. (6)@ (U) Passport:@ The
applicant, and each family member immigrating with the applicant, must
submit a
photocopy of the biographic data page of a currently valid passport
and provide
the passport at the interview. In certain circumstances, this
passport
requirement may be waived. See 9
FAM 201.2 for details on immigrant
travel without a passport. (7) (U) Police Certificates: (If
the applicant is 16 years of age or older or
if there is reason to believe a police record exists, they must
provide original
or certified copies of police certificates. See 9 FAM 504.4-4(B)
below. (8) (U) Adoption Documents: If
the applicant is an adopted child and the application to immigrate is
based on
a parent-child relationship, they must submit: (a) (U) An original or
certified
copy of the adoption decree; (b)@ (U) The legal custody decree
if custody occurred before adoption; (c) (U) A statement showing
dates and places where the applicant resided with the adoptive
parent(s); and (d) (U) If the applicant was
adopted when ages 16 or 17, evidence that they were adopted with, or
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after, the
adoption of a natural sibling under the age of 16 by the same adoptive
parents. b. (U) Availability
paid; (2) (U) The petitioner has
submitted a signed Form I-864, Affidavit of Support Under Section 213A
of the
Act; (3) (U) All traveling
applicants have completed Form DS-260, Online Application for
Immigrant Visa
and Alien Registration; and (4) (U) All required police
certificates have been provided. c.@ (U) If Form I-864 is free of
critical errors but the IVIS case
lacks supporting financial documentation, NVC will send an Assessment
Letter to
the petitioner or agent with a list of missing items, instructing the
visa
applicant to present the required information to the consular officer
during
the visa interview. The Assessment L etter
is included in the case file for your information for IVIS cases. d.
(U) Under specific circumstances approved by VO for some IVIS
cases and for all PIVOT cases, NVC will not schedule a visa interview
until all
requested documentation has been provided. NVC refers to this as the
Fully
Qualified process. e. (U) A case that is required
to be Fully Qualified will be reviewed for the following: (1) (U) All
required fees are
paid; (2) (U) All AOS forms are
submitted and void of critical errors; (3)@ (U) All IV application
forms are received and void of critical errors; (4) (U) All civil
are received and meet the guidelines in the Visa Reciprocity and
Country
Documents Finder; (5) (U) Any required
supporting financial evidence from all sponsors is received. (NVC will
send an
assessment letter for IVIS cases if all other requirements are met);
and (6) (U) The only exception to
these rules is if an applicant informs NVC they cannot obtain certain
civil
documents. f. (U) For cases that are
required to be Fully Qualified, there is no limit to the number of
requests for
information that are sent. NVC will continue to send requests for
information
until all necessary fees, forms, and documents are received and
accurate. If
the petitioner or agent does not return the documents within one year
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and a
visa is available, NVC will initiate the administrative process to
begin case
termination. 9 FAM 504.4-5(C) (U) Post Document
Review, Support, and Scheduling 9 FAM 504.4-5(C)(1) @(U) Need
for Standard Operating Procedures (SOP) (CT:VISA-1864; 0 11-16-2023)
a. (U) Standard
Procedures and Forms Have Been Developed and Installed in All IV units
to: (1) (U) Ensure uniformity in
explaining the requirements of the law to visa applicants; (2) (U)
Reduce individual
correspondence and possible misunderstandings arising therefrom; and
(3) (U) Eliminate needless
files and record-keeping by requiring applicants to retain their
personal
documents until the final step in the processing of the case is
reached. b. (U) Document
Review Systems Ask Applicants to Obtain Documents Required for IV
Interview and
Then Submit Them by Upload, Mail, Courier, or Drop Box for IV units to
Review: (1) (U) If possible,
applicants should not appear in person with these documents until
scheduled for
interview; and (2) (U) Under such a
procedure, applicants are "documentarily complete" only when they
have demonstrated that they have in their possession all the documents
required. c.@ (U) It is important in such
a prescreening procedure that detailed SOP provide guidance to LE
Staff
screeners to limit misunderstandings and accusations of impropriety.
Specifically, the SOP must provide: (1) (U) Written standards for
documents submitted; (2)@ (U) Escalation procedures
in cases when, despite repeated appearances at the consular section,
the
applicant remains unprepared; (3) (U) Procedures for
handling multiple secondary documents submitted in lieu of requested
primary
documents; (4)@ (U) Procedures for
documenting contacts with applicants or their agents as the documents
submitted and reviewed. Notes recording these contacts should be
concise but
complete and should utilize the comments feature in the IVO system;
and (5) (U) Provisions for regular
officer oversight of the process, including regular detailed audits of
individual cases and questions to applicants during the interview
concerning
their experience with the prescreening process. 9 \text{ FAM } 504.4-5(C)(2)
🖟 (U)
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Flexibility in Determining Whether Applicant Is Documentarily

Query: Can you provide a summary of all the inputs required to fill out a I-94 form?

Now use the template below for follow up questions with the chatbot.

Based on the information provided, individuals with an advanced degree in computer science may be eligible for the H-1B visa. The H-1B visa is available for applicants who are qualified to perform services in a specialty occupation that requires the attainment of a bachelor's degree or higher in a specific specialty.

To qualify for the H-1B visa, you would need to demonstrate that you have completed an advanced degree in computer science or a related field. Additionally, you would need to provide evidence of your eligibility, such as an official academic record showing your degree, letters from current or former employers demonstrating your experience, and any other relevant documentation.

It's important to note that the H-1B visa program has specific requirements and limitations, including the need for an employer to file a labor condition application (LCA) with the Department of Labor (DOL) and the availability of H-1B visa numbers. It is advised to consult with an immigration attorney or review the official USCIS guidelines for the most accurate and up-to-date information regarding H-1B visa eligibility and application processes.

```
prompt = HumanMessage(
    content=augment_prompt(
        "I have a job offer from a US employer, who promises to obtain a LCA. What are other requirements are set by the USCIS?"
    )
)
res = chat(messages + [prompt])
print(res.content)
```

In addition to obtaining a Labor Condition Application (LCA) from your potential employer, there are other requirements set by the United

States Citizenship and Immigration Services (USCIS) for nonimmigrant visas. Here are some key requirements to consider:

- 1. Specialty Occupation: The job you are being offered must qualify as a "specialty occupation." This means that the position requires a theoretical and practical application of specialized knowledge and a minimum of a bachelor's degree or its equivalent in the specific specialty.
- 2. Qualifications: You must demonstrate that you have the required qualifications for the job, including the necessary education or equivalent experience.
- 3. Validity of Visa: The validity of the visa should not exceed the validity period of the LCA. The maximum validity period for E-3 visas, for example, is 24 months.
- 4. Intent to Work Temporarily: You must demonstrate that you do not intend to remain or work permanently in the United States and that you plan to work temporarily in the specific job for which the visa is being sought.
- 5. Fees: Apart from the normal visa-related Machine Readable Visa (MRV) fees, there are no additional fees associated with the issuance of an E-3 visa.
- 6. Public Charge Concerns: You need to evaluate potential public charge concerns, particularly if you are planning to work part-time or if you have multiple job offers with different LCAs. Each employment situation must overcome public charge concerns on its own.
- 7. Change of Plans: If there is a material change in your plans after the visa has been issued, such as a change of employer, type of work, or location of employment, you may need to obtain certification for the new employment or satisfy certification requirements before the visa can be used.
- It's important to note that these requirements may vary depending on the specific nonimmigrant visa category you are applying for, so it's advisable to consult the USCIS website or contact an immigration attorney for detailed and up-to-date information.