```
1 import yt_dlp
   2 import os
   4 # Step 1: Download Audio from YouTube with Cookies
   5 def download audio(youtube url, output path="audio.mp3"):
            ydl_opts = {
                   'format': 'bestaudio/best',
   8
                    'outtmpl': output_path.replace('.mp3', ''), # Remove .mp3 for yt-dlp to handle extension
   9
                    'postprocessors': [{
 10
                          'key': 'FFmpegExtractAudio',
                          'preferredcodec': 'mp3',
 11
                           'preferredquality': '192',
 12
 13
                   }],
                    'cookiefile': 'cookies.txt' # Use cookies to bypass restrictions
 14
 15
 16
 17
            with yt_dlp.YoutubeDL(ydl_opts) as ydl:
 18
                   ydl.download([youtube_url])
 19
            # Fix the file name if it ends up as audio.mp3.mp3
 20
            downloaded_file = output_path.replace('.mp3', '.mp3.mp3')
 21
 22
            if os.path.exists(downloaded_file):
 23
                   os.rename(downloaded_file, output_path)
 24
 25 # Replace with your YouTube link
 26 youtube_url = "https://youtu.be/sK8SILOM37I"
 27 download_audio(youtube_url)
       [youtube] Extracting URL: <a href="https://youtu.be/sK8SILOM371">https://youtu.be/sK8SILOM371</a>
       [youtube] sK8SILOM37I: Downloading webpage
       [youtube] sK8SILOM37I: Downloading tv client config
       [youtube] sK8SILOM37I: Downloading player f6e09c70
       [youtube] sK8SILOM37I: Downloading tv player API JSON
       [youtube] sK8SILOM37I: Downloading ios player API JSON
       [youtube] sK8SILOM37I: Downloading m3u8 information
       [info] sK8SILOM37I: Downloading 1 format(s): 251
       [download] Destination: audio
       [download] 100% of 39.37MiB in 00:00:04 at 9.49MiB/s
       [ExtractAudio] Destination: audio.mp3
       Deleting original file audio (pass -k to keep)
  1 #!pip install yt_dlp
  1 from IPython.display import Audio
  3 # Path to the downloaded audio file
  4 audio_file = "audio.mp3"
  6 # Play the audio
  7 Audio(audio file)
\overline{\Sigma}
                 0:00 / 57:22
  1 #!pip install youtube_transcript_api
  1 #!pip install pydub
  1 #!pip install SpeechRecognition
  1 #!pip install pytube
  1 pip install deepmultilingualpunctuation

→ Collecting deepmultilingualpunctuation
          Downloading deepmultilingualpunctuation-1.0.1-py3-none-any.whl.metadata (4.0 kB)
       Requirement already satisfied: torch>=1.8.1 in /usr/local/lib/python3.11/dist-packages (from deepmultilingualpunctuation) (2.5.1
       Requirement already satisfied: transformers in /usr/local/lib/python3.11/dist-packages (from deepmultilingualpunctuation) (4.48.
       Requirement already satisfied: filelock in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultilingualpunctuatic
       Requirement already satisfied: typing-extensions>=4.8.0 in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultil
       Requirement already satisfied: networkx in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultilingualpunctuatic
       Requirement \ already \ satisfied: \ jinja2 \ in \ /usr/local/lib/python 3.11/dist-packages \ (from \ torch>=1.8.1-> deep multilingual punctuation \ (from \ torch>=1.8.1-> de
       Requirement already satisfied: fsspec in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultilingualpunctuation
       Collecting nvidia-cuda-nvrtc-cu12==12.4.127 (from torch>=1.8.1->deepmultilingualpunctuation)
          Downloading nvidia_cuda_nvrtc_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
       Collecting nvidia-cuda-runtime-cu12==12.4.127 (from torch>=1.8.1->deepmultilingualpunctuation)
          Downloading nvidia_cuda_runtime_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
```

```
Collecting nvidia-cuda-cupti-cu12==12.4.127 (from torch>=1.8.1->deepmultilingualpunctuation)
         Downloading nvidia_cuda_cupti_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl.metadata (1.6 kB)
     Collecting nvidia-cudnn-cu12==9.1.0.70 (from torch>=1.8.1->deepmultilingualpunctuation)
         Downloading nvidia_cudnn_cu12-9.1.0.70-py3-none-manylinux2014_x86_64.whl.metadata (1.6 kB)
     Collecting nvidia-cublas-cu12==12.4.5.8 (from torch>=1.8.1->deepmultilingualpunctuation)
        Downloading nvidia_cublas_cu12-12.4.5.8-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
     Collecting nvidia-cufft-cu12==11.2.1.3 (from torch>=1.8.1->deepmultilingualpunctuation)
        Downloading nvidia_cufft_cu12-11.2.1.3-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
     \label{lem:collecting} \textbf{Collecting nvidia-curand-cul2==10.3.5.147 (from torch>=1.8.1-> deep multilingual punctuation)}
        Downloading nvidia_curand_cu12-10.3.5.147-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
     Collecting nvidia-cusolver-cu12==11.6.1.9 (from torch>=1.8.1->deepmultilingualpunctuation)
        Downloading nvidia_cusolver_cu12-11.6.1.9-py3-none-manylinux2014_x86_64.whl.metadata (1.6 kB)
     Collecting nvidia-cusparse-cu12==12.3.1.170 (from torch>=1.8.1->deepmultilingualpunctuation)
        Downloading nvidia_cusparse_cu12-12.3.1.170-py3-none-manylinux2014_x86_64.whl.metadata (1.6 kB)
     Requirement already satisfied: nvidia-nccl-cu12==2.21.5 in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultil
     Requirement already satisfied: nvidia-nvtx-cu12==12.4.127 in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmult
     Collecting nvidia-nvjitlink-cu12==12.4.127 (from torch>=1.8.1->deepmultilingualpunctuation)
        Downloading nvidia_nvjitlink_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl.metadata (1.5 kB)
     Requirement already satisfied: triton==3.1.0 in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultilingualpunct
     Requirement already satisfied: sympy==1.13.1 in /usr/local/lib/python3.11/dist-packages (from torch>=1.8.1->deepmultilingualpunct
     Requirement already satisfied: mpmath<1.4,>=1.1.0 in /usr/local/lib/python3.11/dist-packages (from sympy==1.13.1->torch>=1.8.1->c
     Requirement already satisfied: huggingface-hub<1.0,>=0.24.0 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmu
     Requirement already satisfied: numpy>=1.17 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingualpunctuation from transformers->deepmultiling
     Requirement already satisfied: packaging>=20.0 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingualpur
     Requirement already satisfied: pyyaml>=5.1 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingualpunctuation from transformers->deepmultiling
     Requirement already satisfied: regex!=2019.12.17 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingual;
     Requirement already satisfied: requests in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingualpunctuatic
     Requirement already satisfied: tokenizers<0.22,>=0.21 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilir
     Requirement already satisfied: safetensors>=0.4.1 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingual
     Requirement already satisfied: tqdm>=4.27 in /usr/local/lib/python3.11/dist-packages (from transformers->deepmultilingualpunctuat
     Requirement already satisfied: MarkupSafe>=2.0 in /usr/local/lib/python3.11/dist-packages (from jinja2->torch>=1.8.1->deepmultili
     Requirement already satisfied: charset-normalizer<4,>=2 in /usr/local/lib/python3.11/dist-packages (from requests->transformers->
     Requirement already satisfied: idna<4,>=2.5 in /usr/local/lib/python3.11/dist-packages (from requests->transformers->deepmultilir
     Requirement already satisfied: urllib3<3,>=1.21.1 in /usr/local/lib/python3.11/dist-packages (from requests->transformers->deepmu
     Requirement already satisfied: certifi>=2017.4.17 in /usr/local/lib/python3.11/dist-packages (from requests->transformers->deepmu
     Downloading deepmultilingualpunctuation-1.0.1-py3-none-any.whl (5.4 kB)
     Downloading nvidia_cublas_cu12-12.4.5.8-py3-none-manylinux2014_x86_64.whl (363.4 MB)
                                                                                363.4/363.4 MB 3.7 MB/s eta 0:00:00
     Downloading nvidia cuda cupti cu12-12.4.127-py3-none-manylinux2014 x86 64.whl (13.8 MB)
                                                                                13.8/13.8 MB 22.0 MB/s eta 0:00:00
     Downloading nvidia_cuda_nvrtc_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl (24.6 MB)
                                                                                24.6/24.6 MB 20.5 MB/s eta 0:00:00
     Downloading nvidia_cuda_runtime_cu12-12.4.127-py3-none-manylinux2014_x86_64.whl (883 kB)
  1 import re
  2 import urllib.parse
  3 import requests
  4 from youtube_transcript_api import YouTubeTranscriptApi
  5 from pytube import YouTube
  6 import speech_recognition as sr
  7 from pydub import AudioSegment
  8 from deepmultilingualpunctuation import PunctuationModel
  9 import os
10 # Initialize model once at the top
11 model = PunctuationModel()
12
13 def extract_video_id(video_url):
14
15
            Extracts the YouTube video ID from various URL formats.
16
17
           parsed_url = urllib.parse.urlparse(video_url)
18
            query_params = urllib.parse.parse_qs(parsed_url.query)
19
            if "v" in query_params:
20
21
                   return query_params["v"][0]
22
           \verb|match| = re.search(r"(youtu\.be/|youtube\.com/embed/|youtube\.com/shorts/)([\w-]+)", video\_url)|
23
24
            if match:
25
                  return match.group(2)
26
27
            return None
28
29 def download_audio(video_url):
30
31
           Downloads the audio using yt-dlp with cookies and returns the file path.
32
33
34
                  ydl_opts = {
35
                          'format': 'bestaudio/best',
                          'outtmpl': 'audio.%(ext)s'
36
37
                          'cookiefile': 'cookies (1).txt', # Use the exported cookies
38
                          'postprocessors': [{
                                 'key': 'FFmpegExtractAudio',
39
                                 'preferredcodec': 'mp3',
```

```
41
                    'preferredquality': '192',
 42
                }1.
 43
 44
            with yt_dlp.YoutubeDL(ydl_opts) as ydl:
 45
                info = ydl.extract_info(video_url, download=True)
 46
                return "audio.mp3"
 47
       except Exception as e:
            return f"Error downloading audio: {str(e)}"
48
 49
 50 def convert_audio_to_wav(audio_file):
 51
 52
        Converts the downloaded MP3 audio to WAV format using pydub.
 53
 54
        wav_file = "audio.wav"
 55
       try:
 56
            AudioSegment.from_mp3(audio_file).export(wav_file, format="wav")
 57
            return wav_file
 58
        except Exception as e:
 59
            return f"Error converting to WAV: {str(e)}"
 60
 61 def transcribe_audio(audio_path, chunk_length=30):
 62
 63
        Splits audio into smaller chunks, transcribes each chunk separately,
 64
       and adds punctuation using deepmultilingualpunctuation library.
 65
       recognizer = sr.Recognizer()
 66
 67
        audio = AudioSegment.from_wav(audio_path)
       total_duration = len(audio) / 1000 # Convert to seconds
 68
 69
       transcribed_text = []
 70
 71
       # Load punctuation model
 72
       model = PunctuationModel()
 73
        \verb"print("Transcribing audio in chunks...")"
 74
 75
 76
       # In transcribe audio()
 77
        punctuated_chunks = []
 78
        for chunk_text in transcribed_text:
            punctuated = model.restore_punctuation(chunk_text)
 79
            punctuated_chunks.append(punctuated)
 80
 81
            return " ".join(punctuated chunks)
 82
 83
        # Split and transcribe audio in chunks
 84
       for start in range(0, int(total_duration), chunk_length):
 85
            end = min(start + chunk_length, int(total_duration))
            chunk = audio[start * 1000:end * 1000] # Extract chunk in milliseconds
 86
            chunk.export("chunk.wav", format="wav") # Save chunk temporarily
 87
 88
 89
            with sr.AudioFile("chunk.wav") as source:
 90
                try:
 91
                    audio_data = recognizer.record(source)
 92
                    text = recognizer.recognize_google(audio_data)
 93
                    transcribed_text.append(text)
                except sr.UnknownValueError:
 94
 95
                    transcribed_text.append("[Unintelligible]")
 96
                except sr.RequestError as e:
 97
                    return f"Error with the speech recognition service: {str(e)}"
 98
 99
       os.remove("chunk.wav") # Clean up temporary chunk file
100
        # Combine chunks and add punctuation
101
        combined_text = " ".join(transcribed_text)
102
103
        punctuated_text = model.restore_punctuation(combined_text)
104
105
        return punctuated_text
106
107 def get_transcript_unlisted(video_url):
108
        Tries to fetch the transcript using youtube_transcript_api first,
109
110
        then falls back to downloading and transcribing audio if necessary.
111
112
       model = PunctuationModel() # Initialize once
113
       video_id = extract_video_id(video_url)
114
115
       if not video id:
116
            return "Invalid YouTube URL."
117
       # Try API path with punctuation
118
119
120
           transcript = YouTubeTranscriptApi.get_transcript(video_id)
            raw_text = " ".join([item['text'] for item in transcript])
121
            return model.restore_punctuation(raw_text) # <-- Critical fix</pre>
```

```
123
 124
                     print("Transcript not available via API, attempting audio transcription...")
 125
 126
              # Audio fallback path (existing implementation)
              \#\ldots rest of audio processing code \ldots
 127
 128
              # Download and transcribe audio if no transcript is available
 129
              audio_file = download_audio(video_url)
              if "Error" in audio_file:
130
                     return audio_file
 131
 132
 133
              wav_file = convert_audio_to_wav(audio_file)
             if "Error" in wav_file:
 134
                     return wav_file
 135
 136
137
              transcription = transcribe audio(way file)
 138
 139
              # Cleanup temporary files
              os.remove(audio file)
140
 141
             os.remove(wav_file)
 142
143
              return transcription
 144
 145 # Example usage
 146 # Example usage
 147 if __name__ == "__main__":
              video url = input("Enter the YouTube video URL: ")
 148
 149
              transcript = get_transcript_unlisted(video_url)
150
151
              # Save transcript to a text file
              if "Error" not in transcript and "Invalid YouTube URL." not in transcript:
 152
                     output_file = "transcript.txt"
 153
 154
                     with open(output_file, "w", encoding="utf-8") as file:
 155
                            file.write(transcript)
156
                     print(f"\nTranscript saved successfully to {output_file}")
 157
158
                     print("\n", transcript)
/wsr/local/lib/python3.11/dist-packages/huggingface_hub/utils/_auth.py:94: UserWarning:
        The secret `HF_TOKEN` does not exist in your Colab secrets.
       To authenticate with the Hugging Face Hub, create a token in your settings tab (<a href="https://huggingface.co/settings/tokens">https://huggingface.co/settings/tokens</a>), set it as :
        You will be able to reuse this secret in all of your notebooks.
       Please note that authentication is recommended but still optional to access public models or datasets.
          warnings.warn(
        config.json: 100%
                                                                                                         892/892 [00:00<00:00. 29.9kB/s]
        model.safetensors: 100%
                                                                                                                  2.24G/2.24G [00:23<00:00, 129MB/s]
        tokenizer_config.json: 100%
                                                                                                                      406/406 [00:00<00:00, 23.3kB/s]
                                                                                                                            5.07M/5.07M [00:00<00:00, 77.4MB/s]
        sentencepiece.bpe.model: 100%
        tokenizer.ison: 100%
                                                                                                            17.1M/17.1M [00:00<00:00, 154MB/s]
                                                                                                                            239/239 [00:00<00:00, 16.0kB/s]
        special_tokens_map.json: 100%
       Device set to use cpu
        /usr/local/lib/python 3.11/dist-packages/transformers/pipelines/token\_classification.py: 170: UserWarning: `grouped\_entities` is depression of the properties of the propert
           warnings.warn(
       Enter the YouTube video URL: <a href="https://youtu.be/sK8SILOM37I">https://youtu.be/sK8SILOM37I</a>
       Device set to use cpu
       Transcript saved successfully to transcript.txt
  1 import re
   2 import os
  4 def format_transcript_sentences(input_file, output_file=None):
  5
  6
            Processes a transcript text file to add line breaks after sentences.
  8
            Args:
  9
                   input_file: Path to the original transcript file
 10
                   output_file: Path for formatted file (default: adds '_formatted' suffix)
 11
 12
 13
                  Path to the formatted file or error message
 14
 15
                   # Read input file
16
 17
                   with open(input_file, 'r', encoding='utf-8') as f:
 18
                           raw_text = f.read().replace('\n', ' ') # Remove existing newlines
 19
                   # Split into sentences using punctuation followed by whitespace
 21
                   sentences = re.split(r'(?<=[.!?]) +', raw_text)</pre>
```

16

17 18 19

20 21

22 23

24

25 26 27 try:

Load ML models

Read and split sentences

if len(sentences) < min length:</pre>

```
NLPapproach.ipynb - Colab
22
           # Format with each sentence on new line and proper capitalization
23
           formatted_text = []
24
25
           for sentence in sentences:
               sentence = sentence.strip()
26
27
               if sentence:
28
                   # Capitalize first letter of each sentence
29
                   formatted_sentence = sentence[0].upper() + sentence[1:]
                   formatted_text.append(formatted_sentence)
30
31
           formatted_text = '\n'.join(formatted_text)
32
           # Create output filename if not provided
34
35
           if not output_file:
               base, ext = os.path.splitext(input_file)
36
37
               output_file = f"{base}_formatted{ext}"
38
39
           # Write formatted text
           with open(output_file, 'w', encoding='utf-8') as f:
40
41
               f.write(formatted_text)
42
           return output_file
43
44
45
       except FileNotFoundError:
           return f"Error: File '{input_file}' not found"
46
47
       except Exception as e:
48
           return f"Error processing file: {str(e)}"
49
50 # Example usage
       _name__ == "__main__":
input_path = input("Enter path to transcript file: ").strip()
51 if __name__ == '
52
53
       result = format_transcript_sentences(input_path)
54
       if "Error" in result:
55
           print(f"\n{result}")
56
57
       else:
58
           print(f"\nFormatted transcript saved to: {result}")
           print("\nFirst 5 lines of formatted text:")
           with open(result, 'r', encoding='utf-8') as f:
60
61
               print(''.join(f.readlines()[:5]))
First path to transcript file: /content/transcript.txt
    Formatted transcript saved to: /content/transcript_formatted.txt
    First 5 lines of formatted text:
    So, sir, we know that India has seen a huge Revolution with digital payments.
    We all thought that India is a place- at least the West thought- that India is a place where, uh, many people do not get a square me
    That was the narrative some 30 years ago.
    And not many are literate- people cannot read, um.
    But then we have now shown that digital payments number one is India, while people thought that it wouldn't even come to top 50, let
  1 import numpy as np
  2 from sklearn.metrics.pairwise import cosine_similarity
  3 from sklearn.feature_extraction.text import TfidfVectorizer
  4 from sentence_transformers import SentenceTransformer
  6 def semantic_segmentation(input_file, output_file=None, min_length=3, threshold=0.65):
  7
  8
        Segments text into meaningful chunks with semantic coherence and keywords.
  9
 10
        Args:
 11
            input_file: Path to formatted transcript file
            output_file: Output path (default: adds '_segmented' suffix)
 12
            min_length: Minimum sentences per segment
 13
            threshold: Semantic similarity threshold (0-1)
 14
 15
```

```
https://colab.research.google.com/drive/1Ktsh1UvUC0XAChC-0l6pcpQBgBBzCvJt#printMode=true
```

sentences = [line.strip() for line in f if line.strip()]

return f"Need at least {min_length} sentences for segmentation"

Path to segmented file or error message

model = SentenceTransformer('all-MiniLM-L6-v2')

with open(input_file, 'r', encoding='utf-8') as f:

```
29
30
            # Generate sentence embeddings
31
           embeddings = model.encode(sentences)
 32
           # Create segments with semantic coherence
33
 34
           segments = []
 35
           current_segment = []
           current_emb = None
36
 37
 38
           for sent, emb in zip(sentences, embeddings):
39
                emb = emb.reshape(1, -1)
                if not current_segment:
                    current_segment.append(sent)
41
42
                    current_{emb} = emb
                    continue
43
44
45
                similarity = cosine_similarity(current_emb, emb)[0][0]
               if similarity >= threshold and len(current_segment) < 5:</pre>
46
47
                    current_segment.append(sent)
48
                    current_emb = (current_emb * len(current_segment) + emb) / (len(current_segment) + 1)
49
                else:
                    if len(current_segment) >= min_length:
 50
51
                        segments.append(current_segment)
 52
                    current_segment = [sent]
 53
                    current_emb = emb
 54
 55
           # Finalize remaining sentences
56
           if current segment:
57
                if segments and len(current_segment) < min_length:</pre>
                    segments[-1].extend(current_segment)
 58
59
                else:
 60
                    segments.append(current_segment)
 61
           # Extract keywords for each segment
62
 63
            results = []
           for seg in segments:
64
                vectorizer = TfidfVectorizer(stop_words='english', ngram_range=(1,2))
65
                X = vectorizer.fit_transform([' '.join(seg)])
                features = vectorizer.get_feature_names_out()
67
 68
                keywords = features[np.argsort(X.toarray())[0][-3:]][::-1]
69
70
               results.append({
 71
                    'sentences': seg,
                    'keywords': keywords,
72
 73
                    'count': len(seg)
 74
               })
75
           # Create output filename
 76
 77
           if not output_file:
78
                base, ext = os.path.splitext(input_file)
                output_file = f"{base}_segmented{ext}"
79
80
 81
           # Write segmented output
           with open(output_file, "w") as f:
82
83
                for i, seg in enumerate(results, 1):
                    f.write(f"Segment \{i\} (\{seg['count']\} \ sentences \ | \ Keywords: \{', '.join(seg['keywords'])\})\n")
 84
                    f.write('\n'.join(seg['sentences']) + '\n\n')
85
 86
 87
           return output file
88
 89
       except Exception as e:
90
           return f"Error during segmentation: {str(e)}"
91
 92 # Example usage
93 if __name__ == "_
                     __main__":
94
       input_path = input("Enter path to formatted transcript file: ").strip()
       result = semantic_segmentation(input_path)
95
96
97
       if "Error" in result:
98
           print(f"\n{result}")
       else:
99
100
           print(f"\nSegmented transcript saved to: {result}")
```

56

57

58

59

```
Enter path to formatted transcript file: /content/transcript_formatted.txt
     modules.json: 100%
                                                                 349/349 [00:00<00:00, 7.58kB/s]
     config_sentence_transformers.json: 100%
                                                                                  116/116 [00:00<00:00, 1.31kB/s]
                                                                 10.5k/10.5k [00:00<00:00, 117kB/s]
     README.md: 100%
                                                                           53.0/53.0 [00:00<00:00, 750B/s]
     sentence_bert_config.json: 100%
    config.json: 100%
                                                               612/612 [00:00<00:00, 10.9kB/s]
                                                                     90.9M/90.9M [00:00<00:00, 140MB/s]
    model.safetensors: 100%
     tokenizer_config.json: 100%
                                                                       350/350 [00:00<00:00, 15.2kB/s]
     vocab.txt: 100%
                                                             232k/232k [00:00<00:00, 2.71MB/s]
     tokenizer.json: 100%
                                                                 466k/466k [00:00<00:00, 14.2MB/s]
                                                                           112/112 [00:00<00:00, 6.82kB/s]
     special_tokens_map.json: 100%
    config.json: 100%
                                                               190/190 [00:00<00:00, 10.9kB/s]
  1 import numpy as np
  2 from sklearn.metrics.pairwise import cosine_similarity
  3 from sklearn.feature_extraction.text import TfidfVectorizer
  4 from sentence_transformers import SentenceTransformer
  5 import os
  6
  7 def semantic_segmentation(input_file, output_file=None, min_length=3, threshold=0.65):
  8
  9
         Segments text into meaningful chunks with semantic coherence and keywords.
 10
 11
 12
             input_file: Path to formatted transcript file
             output file: Output path (default: adds '_segmented' suffix)
 13
 14
             min_length: Minimum sentences per segment
 15
             threshold: Semantic similarity threshold (0-1)
 16
 17
           Path to segmented file or error message
 18
 19
 20
        try:
             # Load ML models
 21
 22
             model = SentenceTransformer('all-MiniLM-L6-v2')
 23
 24
             # Read and split sentences
 25
             with open(input_file, 'r', encoding='utf-8', errors='ignore') as f:
                 sentences = [line.strip() for line in f if line.strip()]
 26
 27
 28
             if len(sentences) < min length:</pre>
                 return f"Need at least {min_length} sentences for segmentation"
 29
 30
             # Generate sentence embeddings
 31
 32
             embeddings = model.encode(sentences)
 33
 34
            # Create segments with semantic coherence
 35
             segments = []
             current_segment = []
 36
 37
             current_emb = None
 38
             for i, (sent, emb) in enumerate(zip(sentences, embeddings)):
 39
 40
                 emb = emb.reshape(1, -1)
 41
                 if not current_segment:
 42
                     current_segment.append(sent)
                     current_emb = emb
 43
                     continue
 44
 45
 46
                 similarity = cosine_similarity(current_emb, emb)[0][0]
 47
                 if similarity >= threshold and len(current_segment) < 5:</pre>
 48
                     current_segment.append(sent)
                     current_emb = (current_emb * len(current_segment) + emb) / (len(current_segment) + 1)
 49
                 else:
 50
 51
                     # Finalize segment if it meets minimum length
                     if len(current_segment) >= min_length:
 52
 53
                         segments.append(current_segment)
 54
                     else:
                          # If too short, append to previous segment if possible
 55
```

segments[-1].extend(current segment)

segments.append(current segment)

if segments:

else:

```
60
                     current_segment = [sent]
 61
                    current emb = emb
 62
                # Force finalize segment at the end of the file
 63
 64
                if i == len(sentences) - 1:
 65
                     if len(current_segment) >= min_length:
                        segments.append(current_segment)
 66
 67
                     else:
 68
                         # If too short, append to previous segment if possible
 69
                         if segments:
 70
                             segments[-1].extend(current_segment)
 71
 72
                             segments.append(current_segment)
 73
            # Extract keywords for each segment
 74
 75
            results = []
            for seg in segments:
 76
                vectorizer = TfidfVectorizer(stop_words='english', ngram_range=(1,2))
 77
 78
                X = vectorizer.fit_transform([' '.join(seg)])
 79
                features = vectorizer.get_feature_names_out()
                keywords = features[np.argsort(X.toarray())[0][-3:]][::-1]
 80
                results.append({
 82
 83
                     'sentences': seg,
                     'keywords': keywords,
 84
                     'count': len(seg)
 85
 86
                })
 87
 88
            # Create output filename
 89
            if not output_file:
                base, ext = os.path.splitext(input_file)
 90
 91
                output_file = f"{base}_segmented{ext}"
 92
            # Write segmented output
 93
 94
            with open(output_file, "w") as f:
 95
                for i, seg in enumerate(results, 1):
                     f.write(f"Segment \{i\} \ (\{seg['count']\} \ sentences \ | \ Keywords: \{', '.join(seg['keywords'])\}) \setminus n")
 96
                     f.write('\n'.join(seg['sentences']) + '\n\n')
 98
            return output_file
 99
100
101
        except Exception as e:
            return f"Error during segmentation: {str(e)}"
102
103
104 # Example usage
105 if __name__ == "_
                      _main__":
        input_path = input("Enter path to formatted transcript file: ").strip()
106
        result = semantic_segmentation(input_path)
107
108
       if "Error" in result:
109
110
            print(f"\n{result}")
        else:
111
112
            print(f"\nSegmented transcript saved to: {result}")
Free Enter path to formatted transcript file: /content/transcript_formatted.txt
    Segmented transcript saved to: /content/transcript_formatted_segmented.txt
 1 #Now doing the transcription with timestamps
  1 import re
  2 import urllib.parse
  3 import requests
  4 from youtube_transcript_api import YouTubeTranscriptApi
  5 from pytube import YouTube
  6 import speech_recognition as sr
  7 from pydub import AudioSegment
  8 from deepmultilingualpunctuation import PunctuationModel
  9 import os
 10 # Initialize model once at the top
 11 model = PunctuationModel()
 12
 13 def extract_video_id(video_url):
 14
 15
        Extracts the YouTube video ID from various URL formats.
 16
 17
        parsed_url = urllib.parse.urlparse(video_url)
 18
        query_params = urllib.parse.parse_qs(parsed_url.query)
 19
 20
        if "v" in query_params:
 21
            return query_params["v"][0]
```

```
22
       match = re.search(r"(youtu\.be/|youtube\.com/embed/|youtube\.com/shorts/)([\w-]+)", video url)
23
24
       if match:
 25
           return match.group(2)
26
27
       return None
28
29 def download_audio(video_url):
 30
 31
       Downloads the audio using yt-dlp with cookies and returns the file path.
32
 33
           ydl_opts = {
 34
 35
                'format': 'bestaudio/best',
                'outtmpl': 'audio.%(ext)s',
36
                'cookiefile': 'cookies (1).txt', # Use the exported cookies
37
                'postprocessors': [{
 38
                    'key': 'FFmpegExtractAudio',
39
 40
                    'preferredcodec': 'mp3',
41
                    'preferredquality': '192',
42
               }],
 43
           with yt_dlp.YoutubeDL(ydl_opts) as ydl:
44
45
                info = ydl.extract_info(video_url, download=True)
               return "audio.mp3"
46
       except Exception as e:
47
48
            return f"Error downloading audio: {str(e)}"
49
50 def convert_audio_to_wav(audio_file):
 51
       Converts the downloaded MP3 audio to WAV format using pydub.
52
 53
 54
       wav file = "audio.wav"
 55
       try:
 56
           AudioSegment.from_mp3(audio_file).export(wav_file, format="wav")
57
           return wav file
 58
       except Exception as e:
           return f"Error converting to WAV: {str(e)}"
59
60
 61 def transcribe_audio(audio_path, chunk_length=30):
62
63
       Splits audio into smaller chunks, transcribes each chunk separately,
 64
       and adds punctuation using deepmultilingualpunctuation library.
65
66
       recognizer = sr.Recognizer()
 67
       audio = AudioSegment.from_wav(audio_path)
       total_duration = len(audio) / 1000 # Convert to seconds
68
 69
       transcribed_text = []
 70
71
       # Load punctuation model
 72
       model = PunctuationModel()
 73
 74
       print("Transcribing audio in chunks...")
 75
 76
       # In transcribe_audio()
 77
       punctuated_chunks = []
78
       for chunk text in transcribed text:
 79
            punctuated = model.restore_punctuation(chunk_text)
 80
            punctuated chunks.append(punctuated)
            return " ".join(punctuated_chunks)
81
 82
       # Split and transcribe audio in chunks
83
84
       for start in range(0, int(total_duration), chunk_length):
 85
           end = min(start + chunk_length, int(total_duration))
            chunk = audio[start * 1000:end * 1000] # Extract chunk in milliseconds
86
87
            chunk.export("chunk.wav", format="wav") # Save chunk temporarily
88
 89
           with sr.AudioFile("chunk.wav") as source:
 90
               try:
91
                    audio_data = recognizer.record(source)
 92
                    text = recognizer.recognize_google(audio_data)
 93
                    transcribed text.append(text)
 94
                except sr.UnknownValueError:
 95
                   transcribed_text.append("[Unintelligible]")
96
                except sr.RequestError as e:
97
                    return f"Error with the speech recognition service: {str(e)}"
 98
       os.remove("chunk.wav") # Clean up temporary chunk file
99
100
101
       # Combine chunks and add punctuation
        combined_text = " ".join(transcribed_text)
102
        punctuated_text = model.restore_punctuation(combined_text)
```

```
104
105
        return punctuated text
106
107 def get_transcript_unlisted(video_url):
108
109
        Tries to fetch the transcript using youtube_transcript_api first,
110
        then falls back to downloading and transcribing audio if necessary.
111
       model = PunctuationModel() # Initialize once
112
113
       video_id = extract_video_id(video_url)
114
       if not video_id:
115
            return "Invalid YouTube URL."
116
117
118
       # Try API path with punctuation and timestamps
119
            transcript = YouTubeTranscriptApi.get_transcript(video_id)
120
            formatted transcript = []
121
122
            for item in transcript:
123
                start_time = convert_time(item['start'])
                end_time = convert_time(item['start'] + item['duration'])
124
                formatted_transcript.append(f"[{start_time}-{end_time}] {item['text']}")
125
            return model.restore_punctuation(" ".join(formatted_transcript))
126
127
       except:
128
            print("Transcript not available via API, attempting audio transcription...")
129
130
       # Audio fallback path (existing implementation)
       # ... rest of audio processing code ...
131
132
       # Download and transcribe audio if no transcript is available
133
        audio_file = download_audio(video_url)
       if "Error" in audio file:
134
135
           return audio_file
136
       wav_file = convert_audio_to_wav(audio_file)
137
138
       if "Error" in wav_file:
            return wav file
139
140
       transcription = transcribe_audio(wav_file)
141
142
143
       # Cleanup temporary files
144
       os.remove(audio file)
145
       os.remove(wav file)
146
147
       # For audio fallback, timestamps are not directly available
148
       # You might need to manually add timestamps or use a different approach
149
       return transcription
150
151 def convert_time(seconds):
        """Converts seconds to [hrs:mins:seconds] format."""
152
153
       hrs = int(seconds // 3600)
154
      mins = int((seconds % 3600) // 60)
155
       secs = round(seconds % 60, 2)
156
       return f"{hrs:02d}:{mins:02d}:{secs:05.2f}"
157
158 # Example usage
159 # Example usage
160 if __name__ == "__main ":
161
       video_url = input("Enter the YouTube video URL: ")
162
       transcript = get_transcript_unlisted(video_url)
163
       # Save transcript to a text file
164
       if "Error" not in transcript and "Invalid YouTube URL." not in transcript:
165
166
            output_file = "transcript.txt"
167
            with open(output_file, "w", encoding="utf-8") as file:
                file.write(transcript)
168
169
            print(f"\nTranscript saved successfully to {output_file}")
170
       else:
171
            print("\n", transcript)
173 # Example usage
174 # Example usage
175 if __name__ == "_
                     main ":
        video_url = input("Enter the YouTube video URL: ")
176
177
       transcript = get_transcript_unlisted(video_url)
178
179
       # Save transcript to a text file
       if "Error" not in transcript and "Invalid YouTube URL." not in transcript:
180
            output file = "transcript.txt"
181
182
            with open(output_file, "w", encoding="utf-8") as file:
183
                file.write(transcript)
184
            print(f"\nTranscript saved successfully to {output_file}")
```

```
185
                        print("\n", transcript)
 186
→ Device set to use cpu
         /usr/local/lib/python 3.11/dist-packages/transformers/pipelines/token\_classification.py: 170: UserWarning: `grouped\_entities` is depression of the properties of the propert
             warnings.warn(
         Enter the YouTube video URL: <a href="https://youtu.be/sk8SILOM37I">https://youtu.be/sk8SILOM37I</a>
         Device set to use cpu
         Transcript not available via API, attempting audio transcription...
         [youtube] Extracting URL: <a href="https://youtu.be/sK8SILOM371">https://youtu.be/sK8SILOM371</a>
          [youtube] sK8SILOM37I: Downloading webpage
         [youtube] sK8SILOM37I: Downloading tv client config
[youtube] sK8SILOM37I: Downloading player f6e09c70
          [youtube] sK8SILOM37I: Downloading tv player API JSON
          [youtube] sK8SILOM37I: Downloading ios player API JSON
          [youtube] sK8SILOM37I: Downloading m3u8 information
          [info] sK8SILOM37I: Downloading 1 format(s): 251
          [download] Destination: audio.webm
          [download] 100% of 39.37MiB in 00:00:01 at 30.62MiB/s
         [ExtractAudio] Destination: audio.mp3
         Deleting original file audio.webm (pass -k to keep)
         Device set to use cpu
         /usr/local/lib/python3.11/dist-packages/transformers/pipelines/token_classification.py:170: UserWarning: `grouped_entities` is depre
             warnings.warn(
         Transcribing audio in chunks...
         Transcript saved successfully to transcript.txt
         Enter the YouTube video URL: <a href="https://youtu.be/sK8SILOM37I">https://youtu.be/sK8SILOM37I</a>
         Device set to use cpu
         Transcript not available via API, attempting audio transcription...
         [youtube] Extracting URL: <a href="https://youtu.be/sK8SILOM37I">https://youtu.be/sK8SILOM37I</a>
          [youtube] sK8SILOM37I: Downloading webpage
         [youtube] sK8SILOM37I: Downloading tv client config
          [youtube] sK8SILOM37I: Downloading player f6e09c70
          [youtube] sK8SILOM37I: Downloading tv player API JSON
          [youtube] sK8SILOM37I: Downloading ios player API JSON
          [youtube] sK8SILOM37I: Downloading m3u8 information
          [info] sK8SILOM37I: Downloading 1 format(s): 251
          [download] Destination: audio.webm
          [download] 100% of 39.37MiB in 00:00:01 at 33.05MiB/s
         [ExtractAudio] Destination: audio.mp3
         Deleting original file audio.webm (pass -k to keep)
         Device set to use cpu
         /usr/local/lib/python 3.11/dist-packages/transformers/pipelines/token\_classification.py: 170: UserWarning: `grouped\_entities` is depression of the property 
             warnings.warn(
         Transcribing audio in chunks...
         Transcript saved successfully to transcript.txt
   1 pip install nltk scikit-learn
Requirement already satisfied: nltk in /usr/local/lib/python3.11/dist-packages (3.9.1)
         Requirement already satisfied: scikit-learn in /usr/local/lib/python3.11/dist-packages (1.6.1)
         Requirement already satisfied: click in /usr/local/lib/python3.11/dist-packages (from nltk) (8.1.8)
         Requirement already satisfied: joblib in /usr/local/lib/python3.11/dist-packages (from nltk) (1.4.2)
         Requirement already satisfied: regex>=2021.8.3 in /usr/local/lib/python3.11/dist-packages (from nltk) (2024.11.6)
         Requirement already satisfied: tqdm in /usr/local/lib/python3.11/dist-packages (from nltk) (4.67.1)
         Requirement already satisfied: numpy>=1.19.5 in /usr/local/lib/python3.11/dist-packages (from scikit-learn) (1.26.4)
         Requirement already satisfied: scipy>=1.6.0 in /usr/local/lib/python3.11/dist-packages (from scikit-learn) (1.13.1)
         Requirement already satisfied: threadpoolctl>=3.1.0 in /usr/local/lib/python3.11/dist-packages (from scikit-learn) (3.5.0)
   1 import nltk
   2 from sklearn.feature extraction.text import TfidfVectorizer
   3 from sklearn.metrics.pairwise import cosine similarity
   4 from itertools import combinations
   5 import numpy as np
   6 nltk.download('punkt')
   7 nltk.download('stopwords')
   8 nltk.download('wordnet')
   9 nltk.download('omw-1.4')
 10 nltk.download('punkt tab')
 11 # Ensure required resources are downloaded
 12 nltk.download('punkt')
 13
 14 # Function to read transcript from a .txt file
 15 def read_transcript(file_path):
 16
              with open(file_path, 'r', encoding='utf-8') as file:
                      transcript = file.read()
 17
 18
               return transcript
 19
 20 # Function to split transcript into individual sentences
 21 def split_into_sentences(transcript):
               sentences = nltk.sent_tokenize(transcript)
 22
 23
               return sentences
```

```
25 # Function to compute cosine similarity between sentence pairs
26 def compute_cosine_similarity(sentences):
       vectorizer = TfidfVectorizer()
       tfidf matrix = vectorizer.fit transform(sentences)
28
29
       similarity_matrix = cosine_similarity(tfidf_matrix)
30
       return similarity_matrix
31
32 # Function to find similar sentence triplets based on cosine similarity
33 def find_similar_triplets(sentences, similarity_matrix, threshold=0.5):
34
       triplets = []
35
       n = len(sentences)
36
37
       # Generate all combinations of triplets
       for comb in combinations(range(n), 3):
38
39
           i, j, k = comb
           # Check if all pairs within the triplet are similar
40
41
           if (similarity matrix[i][j] > threshold and
42
               similarity_matrix[j][k] > threshold and
43
               similarity_matrix[i][k] > threshold):
               triplets.append([sentences[i], sentences[j], sentences[k]])
44
45
46
       return triplets
47
48 # Function to write the segmented sentences to a new .txt file
49 def write_segments_to_file(triplets, output_file):
       with open(output_file, 'w', encoding='utf-8') as file:
           for idx, triplet in enumerate(triplets, 1):
51
               file.write(f"Segment {idx}:\n")
52
               for sentence in triplet:
53
                   file.write(sentence + "\n")
54
55
               file.write("\n")
56
57 def main():
       input_file = '/content/transcript (5).txt' # Input .txt file path
58
       output_file = 'segmented_transcript.txt' # Output .txt file path
59
60
61
       # Reading and processing transcript
       transcript = read_transcript(input_file)
62
63
       sentences = split_into_sentences(transcript)
64
       similarity matrix = compute cosine similarity(sentences)
65
66
       # Finding similar sentence triplets
67
       triplets = find_similar_triplets(sentences, similarity_matrix, threshold=0.5)
68
69
       # Writing segments to output file
70
       write_segments_to_file(triplets, output_file)
71
72
       print(f"Segmented transcript saved to {output file}")
73
74 if __name__ == "__main__":
       main()
75
    [nltk_data] Downloading package punkt to /root/nltk_data...
                 Package punkt is already up-to-date!
    [nltk_data] Downloading package stopwords to /root/nltk_data...
    [nltk_data]
                 Package stopwords is already up-to-date!
    [nltk_data] Downloading package wordnet to /root/nltk_data...
                 Package wordnet is already up-to-date!
    [nltk_data]
    [nltk_data] Downloading package omw-1.4 to /root/nltk_data...
    [nltk_data] Package omw-1.4 is already up-to-date!
    [nltk_data] Downloading package punkt_tab to /root/nltk_data...
    [nltk_data]
                 Package punkt_tab is already up-to-date!
    [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Package punkt is already up-to-date!
    Segmented transcript saved to segmented_transcript.txt
 1 pip install nltk scikit-learn numpy
Requirement already satisfied: nltk in /usr/local/lib/python3.11/dist-packages (3.9.1)
    Requirement already satisfied: scikit-learn in /usr/local/lib/python3.11/dist-packages (1.6.1)
    Requirement already satisfied: numpy in /usr/local/lib/python3.11/dist-packages (1.26.4)
    Requirement already satisfied: click in /usr/local/lib/python3.11/dist-packages (from nltk) (8.1.8)
    Requirement already satisfied: joblib in /usr/local/lib/python3.11/dist-packages (from nltk) (1.4.2)
    Requirement already satisfied: regex>=2021.8.3 in /usr/local/lib/python3.11/dist-packages (from nltk) (2024.11.6)
    Requirement already satisfied: tqdm in /usr/local/lib/python3.11/dist-packages (from nltk) (4.67.1)
    Requirement already satisfied: scipy>=1.6.0 in /usr/local/lib/python3.11/dist-packages (from scikit-learn) (1.13.1)
    Requirement already satisfied: threadpoolctl>=3.1.0 in /usr/local/lib/python3.11/dist-packages (from scikit-learn) (3.5.0)
 1 import nltk
 2 from nltk.tokenize import sent tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
```

```
4 from sklearn.metrics.pairwise import cosine_similarity
 5 import numpy as np
 1 nltk.download('punkt')
 2 nltk.download('punkt_tab')
 3 nltk.download('stopwords')
 4 nltk.download('wordnet')
 5 nltk.download('omw-1.4')
→ [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Unzipping tokenizers/punkt.zip.
    [nltk_data] Downloading package punkt_tab to /root/nltk_data...
    [nltk_data] Unzipping tokenizers/punkt_tab.zip.
    [nltk_data] Downloading package stopwords to /root/nltk_data...
    [nltk_data] Unzipping corpora/stopwords.zip.
    [nltk_data] Downloading package wordnet to /root/nltk_data...
    [nltk_data] Downloading package omw-1.4 to /root/nltk_data...
 1 def read_transcript(file_path):
       with open(file_path, 'r') as file:
 3
           transcript = file.read()
       return transcript
 6 def split_into_sentences(transcript):
       return sent tokenize(transcript)
 9 def calculate_cosine_similarity(sentences):
       vectorizer = TfidfVectorizer()
10
11
       tfidf_matrix = vectorizer.fit_transform(sentences)
       cosine_sim = cosine_similarity(tfidf_matrix)
12
13
       return cosine_sim
15 def group_sentences(sentences, cosine_sim, min_sentences=3, max_sentences=10):
16
       grouped_sentences = []
17
       used_indices = set()
18
19
       for i in range(len(sentences)):
20
         if i in used_indices:
21
               continue
22
           group = [sentences[i]]
           used_indices.add(i)
23
24
           for j in range(i + 1, len(sentences)):
25
               if j in used_indices:
26
                   continue
27
               if cosine\_sim[i][j] > 0.5: # Adjust the threshold as needed
28
                   group.append(sentences[j])
29
                   used_indices.add(j)
30
                   if len(group) >= max_sentences:
31
                       break
           if len(group) >= min_sentences:
32
33
               grouped_sentences.append(group)
34
       return grouped_sentences
36 def process_transcript(file_path):
37
       transcript = read_transcript(file_path)
       sentences = split_into_sentences(transcript)
38
39
       cosine_sim = calculate_cosine_similarity(sentences)
40
       grouped_sentences = group_sentences(sentences, cosine_sim)
41
       return grouped_sentences
 1 file_path = '/content/transcript (5).txt'
 2 grouped_sentences = process_transcript(file_path)
 4 for i, group in enumerate(grouped_sentences):
       print(f"Segment {i + 1}:")
       for sentence in group:
 6
 7
           print(sentence)
       print("\n")
→ Segment 1:
    how do I do the transition?
    how do we do this?
    how do we start?
    all kinds of learning are being critized, including learning of soft skills, employability skills, life skills, your hand skills, you
    and all these are skills.
    okay, number one: the curricular structure now specifically provides for employability skills, soft skills and life skills.
```

```
Segment 3:
    absolutely there.
    absolutely, yes, absolutely.
    absolutely, we can.
    Segment 4:
    okay.
    okay.
    physics, right, okay.
    okay.
    Segment 5:
    why?
    why, I see, wonderful.
    why not?
    so for why see why this was not not even thought about?
    Segment 6:
    can I can.
    can?
    we can.
    Segment 7:
    school C, us mhm.
    the way we teach them in school, mhm.
    mhm.
 1 import nltk
 2 from nltk.tokenize import sent_tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import numpy as np
 7 # Download NLTK data
 8 nltk.download('punkt')
 9
10 def read_transcript(file_path):
11
12
           with open(file_path, 'r', encoding='utf-8') as file:
               transcript = file.read()
13
14
           return transcript
15
       except Exception as e:
16
           print(f"Error reading file: {e}")
17
           return None
18
19 def split_into_sentences(transcript):
20
       return sent_tokenize(transcript)
21
22 def calculate_cosine_similarity(sentences):
23
       vectorizer = TfidfVectorizer()
       tfidf_matrix = vectorizer.fit_transform(sentences)
24
25
       cosine_sim = cosine_similarity(tfidf_matrix)
26
       return cosine_sim
27
28 def group_sentences(sentences, cosine_sim, min_sentences=3, max_sentences=10, similarity_threshold=0.5):
       grouped_sentences = []
29
30
       used_indices = set()
31
       for i in range(len(sentences)):
32
33
           if i in used_indices:
34
               continue
35
           group = [sentences[i]]
36
           used_indices.add(i)
           for j in range(i + 1, len(sentences)):
37
               if j in used_indices:
38
39
                   continue
40
               if\ cosine\_sim[i][j] > similarity\_threshold: \# Adjust\ the\ threshold\ as\ needed
41
                   group.append(sentences[j])
42
                   used\_indices.add(j)
43
                   if len(group) >= max_sentences:
44
                       break
45
           if len(group) >= min_sentences:
46
               grouped_sentences.append(group)
47
       return grouped_sentences
48
49 def process_transcript(file_path):
```

```
transcript = read_transcript(file_path)
       if transcript is None:
51
           return [] # Return an empty list if the file couldn't be read
52
53
       sentences = split_into_sentences(transcript)
54
55
       cosine_sim = calculate_cosine_similarity(sentences)
56
       grouped_sentences = group_sentences(sentences, cosine_sim, similarity_threshold=0.6) # Adjusted threshold
57
       return grouped_sentences
59 # Replace with your actual file path
60 file_path = '/content/transcript (5).txt'
61 grouped_sentences = process_transcript(file_path)
62
63 if grouped_sentences:
      for i, group in enumerate(grouped_sentences):
64
65
           print(f"Segment {i + 1}:")
           for sentence in group:
66
67
               print(sentence)
68
           print("\n")
69 else:
      print("No sentences were processed. Check the file path and file content.")
70
    [nltk_data] Downloading package punkt to /root/nltk_data...
                 Package punkt is already up-to-date!
    Segment 1:
    okay.
    okay.
    okay.
    Segment 2:
    why?
    why not?
    why?
    Segment 3:
    can I can.
    can?
    we can.
 1 import nltk
 2 from nltk.tokenize import sent_tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import numpy as np
 7 # Download NLTK data
 8 nltk.download('punkt')
 9
10 def read_transcript(file_path):
11
12
           with open(file_path, 'r', encoding='utf-8') as file:
13
               transcript = file.read()
14
           return transcript
       except Exception as e:
15
           print(f"Error reading file: {e}")
16
17
           return None
18
19 def split_into_sentences(transcript):
       return sent_tokenize(transcript)
20
21
22 def calculate_cosine_similarity(sentences):
23
       vectorizer = TfidfVectorizer()
       tfidf_matrix = vectorizer.fit_transform(sentences)
24
25
       cosine_sim = cosine_similarity(tfidf_matrix)
26
       return cosine sim
27
28 def group_sentences(sentences, cosine_sim, min_sentences=3, max_sentences=10, similarity_threshold=0.5):
       grouped_sentences = []
29
30
       used_indices = set()
31
      for i in range(len(sentences)):
32
33
           if i in used_indices:
34
               continue
35
           group = [sentences[i]]
36
           used_indices.add(i)
           for j in range(i + 1, len(sentences)):
37
38
               if j in used_indices:
39
                   continue
               if\ cosine\_sim[i][j]\ >\ similarity\_threshold\colon\ \#\ Adjust\ the\ threshold\ as\ needed
```

```
41
                   group.append(sentences[j])
42
                   used indices.add(j)
43
                   if len(group) >= max_sentences:
44
45
           if len(group) >= min_sentences:
46
               grouped_sentences.append(group)
       return grouped_sentences
47
48
49 def process_transcript(file_path):
       transcript = read_transcript(file_path)
50
51
       if transcript is None:
           return [] # Return an empty list if the file couldn't be read
52
53
54
       sentences = split_into_sentences(transcript)
       cosine_sim = calculate_cosine_similarity(sentences)
55
56
       grouped_sentences = group_sentences(sentences, cosine_sim, similarity_threshold=0.6) # Adjusted threshold
57
       return grouped_sentences
58
59 # Replace with your actual file path
60 file_path = '/content/transcript (5).txt'
61 grouped_sentences = process_transcript(file_path)
63 if grouped_sentences:
64
       for i, group in enumerate(grouped_sentences):
           print(f"Segment {i + 1}:")
65
           for sentence in group:
66
67
               print(sentence)
           print("\n")
68
69 else:
       print("No sentences were processed. Check the file path and file content.")
→ [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk data]
                  Package punkt is already up-to-date!
    Segment 1:
    okay.
    okay.
    okay.
    Segment 2:
    why?
    why not?
    why?
    Segment 3:
    can I can.
    can?
    we can.
 1 #Cosine Similarity approach
 1 import nltk
 2 from nltk.tokenize import sent_tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
10 def read_transcript(file_path):
11
       try:
           with open(file_path, 'r', encoding='utf-8') as file:
12
13
               transcript = file.read()
           return transcript
14
15
       except Exception as e:
           print(f"Error reading file: {e}")
16
           return None
17
18
19 def split_into_sentences(transcript):
       return sent_tokenize(transcript)
20
21
22 def calculate_cosine_similarity(sentences):
23
       vectorizer = TfidfVectorizer()
       tfidf_matrix = vectorizer.fit_transform(sentences)
25
       cosine_sim = cosine_similarity(tfidf_matrix)
26
       return cosine_sim
27
28 def save_cosine_similarity_to_csv(cosine_sim, sentences, output_file):
       # Create a DataFrame for the cosine similarity matrix
```

```
df = pd.DataFrame(cosine_sim, index=sentences, columns=sentences)
31
32
       # Save the DataFrame to a CSV file
33
       df.to_csv(output_file)
       print(f"Cosine similarity matrix saved to {output file}")
34
35
36 def process_transcript(file_path, output_file):
       # Read the transcript
37
       transcript = read_transcript(file_path)
38
39
       if transcript is None:
40
           return
41
       # Split the transcript into sentences
42
43
       sentences = split_into_sentences(transcript)
       print("Sentences extracted:")
44
45
       for i, sentence in enumerate(sentences):
           print(f"{i + 1}: {sentence}")
46
47
48
       # Calculate cosine similarity between sentences
49
       cosine_sim = calculate_cosine_similarity(sentences)
50
51
       # Save the cosine similarity matrix to a CSV file
52
       save_cosine_similarity_to_csv(cosine_sim, sentences, output_file)
53
54 # File paths (adjust as needed)
55 file path = '/content/transcript (5).txt' # Path to your uploaded transcript file
56 output_file = '/content/cosine_similarity_matrix.csv' # Output CSV file name
58 # Process the transcript and generate the CSV file
59 process_transcript(file_path, output_file)
→ [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Package punkt is already up-to-date!
    Sentences extracted:
    1: so, sir, we know that India has seen a huge Revolution with digital payments.
    2: we all thought that India is a place- at least the West thought- that India is a place where, uh, many people do not get a squ
    3: that was the narrative some 30 years ago.
    4: and not many are literate- people cannot read, um.
    5: but then we have now shown that digital payments number one is India, while people thought that it wouldn't even come to top 9
    6: I think, immediately after UPA, the next big revolution, personally, I think, is in education, and the complete homework for t
    7: sir, my question is: do you think norf plus NEP put together will be the next big revolution after UPA in India?
    8: absolutely, and why I think so is because in education, the last policy came up many, many years ago- that was in 1986, which
    9: so so many changes have happened in the real world.
    10: so many changes have happened in the requirement of the industry, requirement of Manpower for the industry.
    11: however, there were no corresponding changes which happened?
    12: education system.
    13: so, therefore, I feel that this was the right time when we brought in the education policy 2020, honorable prime minister, de
    14: 2020 is a policy, the NP 2020 is a policy, and for implementing a policy, you need a framework.
    15: now, why we call it a framework?
    16: we call it a framework because this is very flexible.
    17: this allows you all the Innovation, the way you educate your kids, you educate your students.
    18: still, it provides you the basic guidelines, the, the framework, the outer layer it provides, and that layer is mostly the er
    19: that is such an enabling layer that it has broken the shackles which were there in the education sector, right?
    20: so, yes, it is a big Revolution and this is going to change the way we have been educating our kids and this will be Game Cha
    21: so, sir, I think, um, uh, let's go with this example of, let's say, I started off living in a small 2bhk apartment M and I sl
    22: right, and one fine day, you came and you changed my kitchen completely.
    23: I was using a bicycle, I moved to a scooter and a car and now you're asking me to fly and you're giving me an aircraft.
    24: NEP sounds more like that for me.
    25: how do I do the transition?
    26: I fear that I will.
    27: I will crash if I use a aeroplane without training.
    28: I'm talking about all the teachers in the in the country, all the schools in the country.
    29: we have been driving buses at Max.
    30: now we should fly.
    31: how do we do this?
    32: okay, look at the requirement of the industry.
    33: requirement of the industry has been moving very fast.
    34: the technology is emerging every day and the industry is moving with that speed.
    35: so when a student is coming out of your Institute and is going out in the market, he finds that whatever he has been taught h
    36: when industry is moving that fast, when the requirement is moving that fast, don't you think it is important for us to change
    37: yes, how long can we wait?
    38: yes, it will take a lot of effort for every one of us to adapt to this change.
    39: but this change is going to be not only beneficial, mhm, but also very facilitative for all of us, very liberating for all of
    40: this is going to be highly liberative and choice-based system.
    41: there are number of choices which are available to you, which are available to every student.
    42: yes, when we introduce a new system, we have to really create, create new things, create new ways of doing things, learn some
    43: but once we learn it, there is no limit to Innovation and creativity which this will bring.
    44: there's going to be a learning curve here.
    45: you mean, it's going to be difficult to fly a fighter, not really difficult to apply, because all of us we have that kind of
    46: only thing is that we were not translating our vision and Innovative Minds into the education sector, whereas we are applying
    47: know we are, we are moving very fast.
    48: it's only education and I think the education sector is the smartest sector, which is very good at learning, and I'm I'm very
    49: I can tell you that already a number of Institutions have adopted the NEP and norf to varying degrees and whereever they have
    50: so then, um, um, I have spoken to many academics.
    51: most of us do not understand NEP.
    52: let on ncrf, which is the next step on how to implement NEP.
    53: if I can request you to give me an elevator pitch for NEP and then an elevator pitch for ncrf, for the exclusive reason that
```

A

```
1 import nltk
 2 from nltk.tokenize import sent_tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
10 def read_transcript(file_path):
11
12
            with open(file_path, 'r', encoding='utf-8') as file:
13
                transcript = file.read()
14
           return transcript
15
       except Exception as e:
           print(f"Error reading file: {e}")
16
17
           return None
18
19 def split into sentences(transcript):
       return sent_tokenize(transcript)
21
22 def calculate_cosine_similarity(sentences):
23
       vectorizer = TfidfVectorizer()
24
       tfidf_matrix = vectorizer.fit_transform(sentences)
25
       cosine_sim = cosine_similarity(tfidf_matrix)
26
       return cosine sim
27
28 def save_cosine_similarity_to_csv(cosine_sim, sentences, output_file):
       # Create sentence names (S1, S2, S3, ...)
29
30
       sentence_names = [f"S{i+1}" for i in range(len(sentences))]
31
32
       # Create a DataFrame for the cosine similarity matrix
33
       df = pd.DataFrame(cosine_sim, index=sentence_names, columns=sentence_names)
34
35
       # Save the DataFrame to a CSV file
36
       df.to_csv(output_file)
       print(f"Cosine similarity matrix saved to {output file}")
37
38
39 def process_transcript(file_path, output_file):
40
       # Read the transcript
41
       transcript = read_transcript(file_path)
       if transcript is None:
42
43
           return
44
       # Split the transcript into sentences
45
46
       sentences = split_into_sentences(transcript)
47
       print("Sentences extracted:")
48
       for i, sentence in enumerate(sentences):
49
           print(f"S{i + 1}: {sentence}")
50
51
       # Calculate cosine similarity between sentences
       cosine_sim = calculate_cosine_similarity(sentences)
52
53
54
       # Save the cosine similarity matrix to a CSV file
55
       save_cosine_similarity_to_csv(cosine_sim, sentences, output_file)
56
57 # File paths (adjust as needed)
58 file_path = '/content/transcript (5).txt' # Path to your uploaded transcript file
59 output_file = '/content/cosine_similarity_matrix1.csv' # Output CSV file name
61 # Process the transcript and generate the CSV file
62 process_transcript(file_path, output_file)
→ [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Package punkt is already up-to-date!
    Sentences extracted:
    {\sf S1:} so, {\sf sir}, we know that India has seen a huge Revolution with digital payments.
    S2: we all thought that India is a place- at least the West thought- that India is a place where, uh, many people do not get a sc
    S3: that was the narrative some 30 years ago.
    S4: and not many are literate- people cannot read, um.
    S5: but then we have now shown that digital payments number one is India, while people thought that it wouldn't even come to top
    S6: I think, immediately after UPA, the next big revolution, personally, I think, is in education, and the complete homework for S7: sir, my question is: do you think ncrf plus NEP put together will be the next big revolution after UPA in India?
    S8: absolutely, and why I think so is because in education, the last policy came up many, many years ago- that was in 1986, which
    S9: so so many changes have happened in the real world.
    S10: so many changes have happened in the requirement of the industry, requirement of Manpower for the industry.
    S11: however, there were no corresponding changes which happened?
    S12: education system.
    S13: so, therefore, I feel that this was the right time when we brought in the education policy 2020, honorable prime minister, (
    S14: 2020 is a policy, the NP 2020 is a policy, and for implementing a policy, you need a framework.
```

S15: now, why we call it a framework?

```
S16: we call it a framework because this is very flexible.
S17: this allows you all the Innovation, the way you educate your kids, you educate your students.
S18: still, it provides you the basic guidelines, the, the framework, the outer layer it provides, and that layer is mostly the
S19: that is such an enabling layer that it has broken the shackles which were there in the education sector, right?
S20: so, yes, it is a big Revolution and this is going to change the way we have been educating our kids and this will be Game Ch
S21: so, sir, I think, um, uh, let's go with this example of, let's say, I started off living in a small 2bhk apartment M and I s
S22: right, and one fine day, you came and you changed my kitchen completely.
S23: I was using a bicycle, I moved to a scooter and a car and now you're asking me to fly and you're giving me an aircraft.
S24: NEP sounds more like that for me.
S25: how do I do the transition?
S26: I fear that I will.
S27: I will crash if I use a aeroplane without training.
S28: I'm talking about all the teachers in the in the country, all the schools in the country.
S29: we have been driving buses at Max.
S30: now we should fly.
S31: how do we do this?
S32: okay, look at the requirement of the industry.
S33: requirement of the industry has been moving very fast.
S34: the technology is emerging every day and the industry is moving with that speed.
S35: so when a student is coming out of your Institute and is going out in the market, he finds that whatever he has been taught S36: when industry is moving that fast, when the requirement is moving that fast, don't you think it is important for us to chang
S37: yes, how long can we wait?
S38: yes, it will take a lot of effort for every one of us to adapt to this change.
S39: but this change is going to be not only beneficial, mhm, but also very facilitative for all of us, very liberating for all \alpha
S40: this is going to be highly liberative and choice-based system.
S41: there are number of choices which are available to you, which are available to every student.
S42: yes, when we introduce a new system, we have to really create, create new things, create new ways of doing things, learn som
S43: but once we learn it, there is no limit to Innovation and creativity which this will bring.
S44: there's going to be a learning curve here.
S45: you mean, it's going to be difficult to fly a fighter, not really difficult to apply, because all of us we have that kind of
S46: only thing is that we were not translating our vision and Innovative Minds into the education sector, whereas we are applyir
S47: know we are, we are moving very fast.
S48: it's only education and I think the education sector is the smartest sector, which is very good at learning, and I'm I'm ver
S49: I can tell you that already a number of Institutions have adopted the NEP and norf to varying degrees and whereever they have
S50: so then, um, I have spoken to many academics.
S51: most of us do not understand NEP.
S52: let on ncrf, which is the next step on how to implement NEP.
S53: if I can request you to give me an elevator pitch for NEP and then an elevator pitch for ncrf, for the exclusive reason that
```

1 df = pd.read_csv('/content/cosine_similarity_matrix1.csv') 2 df

→	Unname	d: 0	S1	\$2	\$3	S4	S 5	S6	S 7	\$8	S 9	•••	S458	S459	S460
0) ;	S1	1.000000	0.144704	0.018483	0.000000	0.246278	0.091548	0.230970	0.024449	0.060579		0.000000	0.066609	0.000000
1		S2	0.144704	1.000000	0.034696	0.150481	0.230813	0.084158	0.141569	0.094473	0.073300		0.000000	0.104808	0.000000
2	: :	S3	0.018483	0.034696	1.000000	0.000000	0.025220	0.038285	0.011759	0.295992	0.018366		0.000000	0.031778	0.000000
3	;	S4	0.000000	0.150481	0.000000	1.000000	0.056117	0.116833	0.000000	0.145069	0.120146		0.000000	0.000000	0.127874
4		S5	0.246278	0.230813	0.025220	0.056117	1.000000	0.055102	0.053087	0.019148	0.028013		0.088463	0.096468	0.000000
											***				▼
46	52 S4	63	0.019424	0.026095	0.024720	0.000000	0.056461	0.026382	0.027060	0.065532	0.054914		0.093098	0.033396	0.000000
46	3 S4	64	0.061773	0.042473	0.034434	0.000000	0.109107	0.113300	0.036147	0.028488	0.033839		0.051788	0.062190	0.000000
46	54 S4	65	0.058840	0.064283	0.012052	0.071909	0.063745	0.085637	0.083713	0.093791	0.049924		0.089716	0.091426	0.000000
46	55 S4	66	0.087732	0.005907	0.011192	0.000000	0.011617	0.120295	0.104724	0.026829	0.010998		0.046377	0.029276	0.000000
46	66 S4	67	0.000000	0.000000	0.000000	0.027857	0.060456	0.018291	0.043638	0.027710	0.000000		0.000000	0.000000	0.000000
467	7 rows × 468	3 со	lumns												

1 # Import necessary libraries
2 import pandas as pd
3 import seaborn as sns
4 import matplotlib.pyplot as plt
5
6 # Load the uploaded CSV file
7 file_path = '/content/cosine_similarity_matrix1.csv'
8 data = pd.read_csv(file_path)
9
10 # Set the first column as the index and remove the 'Unnamed: 0' column 11 data.set_index('Unnamed: 0', inplace=True)
12
13 # Generate the correlation matrix
14 correlation_matrix = data.corr()
15
16 # Print the correlation matrix summary
17 print("Correlation Matrix Summary:")

```
18 print(correlation_matrix.describe())
20 # Visualize the correlation matrix using a heatmap
21 plt.figure(figsize=(12, 10))
22 sns.heatmap(correlation matrix, annot=False, cmap='coolwarm')
23 plt.title('Correlation Matrix Heatmap')
24 plt.show()
→ Correlation Matrix Summary:
                                S2
                    S1
                                             S3
                                                          S4
                                                                      S5
                                                                                   S6
    count 466.000000
                        466.000000
                                     466.000000
                                                 466.000000
                                                              466.000000
                                                                           466.000000
             0.032835
                          0.075637
                                       0.045360
                                                   0.033332
                                                                0.078733
                                                                             0.150554
    mean
              0.084350
                          0.111592
                                       0.089276
                                                   0.093679
                                                                0.101235
                                                                             0.143893
    std
                                                   -0.080767
                                      -0.074572
                                                                -0.080913
                                                                            -0.126219
             -0.063055
                          -0.099254
    min
    25%
             -0.024712
                          -0.006972
                                      -0.014654
                                                   -0.031607
                                                                0.000692
                                                                             0.039624
    50%
             0.014187
                          0.062486
                                       0.030391
                                                   0.004558
                                                                0.070433
                                                                             0.141213
             0.071348
                                                   0.075962
                                                                0.139049
                                                                             0.249313
    75%
                          0.135054
                                       0.079533
              1,000000
                          1,000000
                                       1,000000
                                                   1,000000
                                                                1,000000
                                                                             1,000000
    max
                    57
                                 S8
                                             59
                                                         S10
                                                                          S458
    count 466.000000
                        466.000000
                                     466,000000
                                                 466.000000
                                                              . . .
                                                                   466.000000
             0.069673
                          0.077276
                                       0.061499
                                                   0.083850
                                                                     0.062465
    mean
                                                              . . .
              0.103796
                          0.104836
                                       0.106447
                                                   0.127883
                                                                     0.125686
    std
                                                              . . .
             -0.097341
                          -0.090755
                                      -0.090614
                                                   -0.106429
                                                                     -0.111943
    min
                                                              . . .
    25%
             -0.003994
                          0.003120
                                      -0.018873
                                                   -0.015841
                                                                     -0.035533
                                                              . . .
    50%
             0.056906
                          0.061219
                                       0.046579
                                                   0.064468
                                                                     0.035272
                                                              . . .
    75%
              0.128066
                          0.135750
                                       0.115556
                                                   0.147639
                                                                     0.135771
                                                              . . .
              1,000000
                          1,000000
                                       1,000000
                                                   1,000000
                                                                     1,000000
    max
                  S459
                              5460
                                           S461
                                                        S462
                                                                    S463
                                                                                 $464
    count 466.000000
                        466.000000
                                     466.000000
                                                 466,000000
                                                              466.000000
                                                                           466.000000
    mean
              0.079398
                         -0.015808
                                       0.099405
                                                   0.091793
                                                                0.031906
                                                                             0.099529
              0.143378
                          0.103117
                                       0.129924
                                                   0.116551
                                                                0.111166
                                                                             0.129182
    std
    min
             -0.123665
                          -0.103533
                                      -0.095591
                                                   -0.089121
                                                                -0.084055
                                                                            -0.117284
             -0.037101
                          -0.059438
                                      -0.003425
                                                   0.004502
                                                               -0.036968
                                                                            -0.008316
    25%
                                                                             0.087770
    50%
              0.043437
                          -0.038165
                                       0.083142
                                                   0.079135
                                                                -0.001110
    75%
              0.177067
                          -0.016561
                                       0.164672
                                                   0.156014
                                                                0.063807
                                                                             0.182374
              1.000000
                          1.000000
                                       1.000000
                                                   1.000000
                                                                1.000000
                                                                             1.000000
    max
                  S465
                              S466
                                           S467
    count 466.000000
                        466.000000
                                     466.000000
    mean
              0.108244
                          0.083739
                                       0.034295
    std
             0.124239
                          0.110004
                                       0.104721
             -0.119478
                          -0.085893
                                      -0.084523
    25%
              0.012929
                          0.003796
                                      -0.029172
                          0.064838
                                       0.000970
    50%
              0.101166
    75%
              0.179246
                          0.148362
                                       0.063946
              1.000000
                          1.000000
                                       1.000000
    max
    [8 rows x 467 columns]
                                               Correlation Matrix Heatmap
                                                                                                                               1.0
       S10
       S19
       528
       S37
       S46
       S55
       S64
       S73
                                                                                                                              - 0.8
       S82
       S91
      S100
      S109
      S127
      S136 ·
 2 from nltk.tokenize import sent tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
 9 nltk.download('punkt_tab')
10 nltk.download('stopwords')
11 nltk.download('wordnet')
12 nltk.download('omw-1.4')
13 nltk.download('punkt')
14 def read_transcript(file_path):
15
       try:
           with open(file_path, 'r', encoding='utf-8') as file:
16
17
                transcript = file.read()
           return transcript
18
19
       except Exception as e:
20
           print(f"Error reading file: {e}")
21
            return None
```

```
23 def split into sentences(transcript):
       return sent_tokenize(transcript)
24
26 def calculate cosine similarity(sentences):
27
       vectorizer = TfidfVectorizer()
28
       tfidf_matrix = vectorizer.fit_transform(sentences)
29
       cosine_sim = cosine_similarity(tfidf_matrix)
       return cosine_sim
30
31
32 def segment_sentences(sentences, cosine_sim, threshold=0.5):
       visited = [False] * len(sentences)
33
34
       segments = []
35
       for i in range(len(sentences)):
36
37
           if not visited[i]:
               segment = [sentences[i]]
38
               visited[i] = True
39
40
41
               # Check for similar sentences
               for j in range(i + 1, len(sentences)):
42
                   if not visited[j] and cosine_sim[i][j] >= threshold:
43
                       segment.append(sentences[j])
44
45
                       visited[j] = True
46
47
               segments.append(segment)
48
49
       return segments
50
51 def print_segments(segments):
       for idx, segment in enumerate(segments, start=1):
52
53
           print(f"\nSegment {idx}:")
54
           for sentence in segment:
               print(f" - {sentence}")
55
56
57 def process_transcript(file_path, threshold=0.5):
58
       # Read the transcript
       transcript = read_transcript(file_path)
59
       if transcript is None:
60
61
           return
62
63
       # Split the transcript into sentences
       sentences = split_into_sentences(transcript)
64
65
       print("Sentences extracted:")
66
       for i, sentence in enumerate(sentences):
67
           print(f"S{i + 1}: {sentence}")
68
69
       # Calculate cosine similarity between sentences
70
       cosine_sim = calculate_cosine_similarity(sentences)
71
72
       # Segment sentences based on similarity
73
       segments = segment_sentences(sentences, cosine_sim, threshold)
74
75
       # Print segmented sentences
76
       print("\nSegmented Sentences:")
77
       print_segments(segments)
78
79 # File path to the transcript
80 file_path = '/content/transcript (8).txt' # Replace with your file path
82 # Process the transcript and print segments with a similarity threshold of 0.5
83 process_transcript(file_path, threshold=0.1)
→ [nltk_data] Downloading package punkt to /root/nltk_data...
    [nltk_data] Package punkt is already up-to-date!
    [nltk_data] Downloading package punkt_tab to /root/nltk_data...
    [nltk data]
                 Unzipping tokenizers/punkt_tab.zip.
    Sentences extracted:
    S1: 0 - 30: so sorry we know that India has seen a huge Revolution with digital payments we all thought that India is a place at
    30 - 60: I think immediately after you play the next big revolution personally I think is an education and the complete homework
    60 - 90: do you think ncrf plus any people together will be the next big revolution after up in India absolutely and why I think
    90 - 120: how many changes have happened in the real world so many changes have happened in the requirement of the industry requi
    120 - 150: July 2020 and we recently celebrated the 4th anniversary of NP 2020 norf has been brought to implement the intent of 2
    150 - 180: this allows you all the Innovation the way you educate your kids you educate your students still it provides you the t
    180 - 210: broken the shackles of which were there in the education sector right so yes it is a big Revolution and this is going
    210 - 240: pull up my kitchen to add to my taste buds in a way that it's convenient for me and one fine day you came and you char
    240 - 270: we have been driving buses at Max now we should fly how do we do this look at the requirement of the industry requirem
    270 - 300: link that whatever he has been taught has no relevance to the real life world when industry is moving that fast when 1
    300 - 330: will you be not only beneficial but also very facilitated for all of us very liberating for all of us this is going to
    330 - 360: new things create new ways of doing things learn something new but once we learn it there is no limit to Innovation ar
    360 - 390: creating our vision and Innovative Minds into the education sector where is we are applying it elsewhere everywhere el
    390 - 420: to be fun for everyone and I can I can tell you that already a number of Institutions have adopted the any pain and CF
    420 - 450: next step on how to implement an AP if I can request you to give me an elevator pitch for an EP and then an elevator p
        - 480: it allows for creditor of all learnings weather in academics orange killing or an experiential learning and all these
```

```
480 - 510: and people who are already skilled or already in the professional area not there the experiential learning would play 🔈
510 - 540: increase of technology which has been created by single Department good question so therefore all of us we have to wor
540 - 570: all kinds of learning are being contractors including learning of soft skills employability skills life skills your ha
570 - 600: go out it's all very flexible so that there's no Dropout there's no Dropout so these three things coupled with use of
600 - 630: I want my son to be an engineer don't you think if we create a give me five approach to Credit Systems everybody will
630 - 660: turn off infrastructure India has today we created in last 1775 years we are going to double that infrastructure in ne
660 - 690: more number of other branches even liberal arts social sciences if I want to be an award Society I would need a proper
690 - 720: have you already seen the Fallout of this know you can see the photo you can see how many Engineers are there for Desi
720 - 750: [Unintelligible]
750 - 780: any of the new technology machines current any laser-based machines any automated operating machines robotic operation
780 - 810: robotic process and that is killing is equally important and this is important in multiple areas and therefore multidi
810 - 840: me and you want to know design a VTech in CSC syllabus or be taking AI syllabus that is Nip complaint under the ncrf 1
840 - 870: are you teaching Teddy teaching Terry is not sufficient if you want the student to really understand and reply that co
870 - 900: those horses are skill bass courses you divide every subject into 30 and its application how do you apply the theory a
900 - 930: who is learning which is happening which which you are going through so then this looks like let's say my student stay
930 - 960: extension of BSC physics or BSC chemistry and you give him the actual knowledge of computer science right in the first
960 - 990: that's unbelievable so that 50% of the time which means two full years and a btech program a person can stay outside 1
990 - 1020: are you learning outcomes and their alignment with the overall curricular structure and then once it comes back we have
1020 - 1050: he gets the credits okay so here is where I have talked with some inhibitions about the entire setup where you are s
1050 - 1080: write although we can keep that a check it is not easy for us to keep some zones green some zones red operational cc
1080 - 1110: what is the guarantee that the student is learning in the campus is there a is there an accident on some kind of a \xi
1110 - 1140: either online or with some time stamps it is it is being documented know what time is done and CVT has videographed
1140 - 1170: she claims that all right he is a good technician and he can repair any kind of car so she prepares you open the BMV
1170 - 1200: Julie appointed by the awarding body which Awards the certificate and then that video is kept forever so you imagine
1200 - 1230: who is giving us I think that's a nail on the head where I think we all should pass for a moment and then think is c
1230 - 1260: experimenting something like this I don't think we'll be damaging I think all the Institute should come out of their
1260 - 1290: [Unintelligible]
1290 - 1320: play nursery and she says it lightly and the answer lies in this new framework and know how many times as you right]
1320 - 1350: it can be adopted but colleges that are approved by a city let's say a state Technical University may not know these
1350 - 1380: of course a price them go and talk to them and then educate them but over and Beyond this there are some subtle prot
1380 - 1410: play by 50% or I'll engage my faculty for the betterment of my students at a level which need not necessarily be tea
1410 - 1440: picture Affiliated to these 1200 University leaving all the ionis that is Institute of national importance but they
S2: 3 4 4
1440 - 1470: do you think this ratio is sufficient to teach a technical subject know once we are sending our students out again t
1470 - 1500: it's not easy to create a project which is outcome based creating that project itself is going to take a lot of time
```

```
1 import nltk
 2 from nltk.tokenize import sent tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
10 def read_transcript(file_path):
11
12
           with open(file_path, 'r', encoding='utf-8') as file:
               transcript = file.read()
13
14
           return transcript
15
       except Exception as e:
16
           print(f"Error reading file: {e}")
17
           return None
18
19 def split_into_sentences(transcript):
       return sent_tokenize(transcript)
20
21
22 def calculate_cosine_similarity(sentences):
      vectorizer = TfidfVectorizer()
23
24
       tfidf_matrix = vectorizer.fit_transform(sentences)
25
       cosine_sim = cosine_similarity(tfidf_matrix)
26
       return cosine sim
27
28 def segment_sentences(sentences, cosine_sim, threshold=0.5):
29
       visited = [False] * len(sentences)
       segments = []
30
31
32
       for i in range(len(sentences)):
           if not visited[i]:
33
34
               segment = [sentences[i]]
35
               visited[i] = True
36
37
               # Check for similar sentences
38
               for j in range(i + 1, len(sentences)):
                   if not visited[j] and cosine_sim[i][j] >= threshold:
39
                       segment.append(sentences[j])
40
41
                       visited[j] = True
42
43
               segments.append(segment)
44
45
       return segments
46
47 def print_segments(segments):
       for idx, segment in enumerate(segments, start=1):
```

```
49
           print(f"\nSegment {idx}:")
           for sentence in segment:
50
               print(f" - {sentence}")
51
53 # New Function to Save Segments to a Text File
54 def save_segments_to_file(segments, output_file):
55
           with open(output_file, 'w', encoding='utf-8') as file:
56
57
               for idx, segment in enumerate(segments, start=1):
                   file.write(f"Segment {idx}:\n")
58
                   for sentence in segment:
59
                       file.write(f" - {sentence}\n")
61
                   file.write("\n")
62
           print(f"Segmented output saved to {output_file}")
       except Exception as e:
63
64
           print(f"Error saving file: {e}")
65
66 def process_transcript(file_path, threshold=0.5, output_file='segmented_output.txt'):
       # Read the transcript
67
68
       transcript = read_transcript(file_path)
69
       if transcript is None:
70
           return
71
72
       # Split the transcript into sentences
73
       sentences = split_into_sentences(transcript)
       print("Sentences extracted:")
74
75
       for i, sentence in enumerate(sentences):
           print(f"S{i + 1}: {sentence}")
76
77
78
       # Calculate cosine similarity between sentences
       cosine_sim = calculate_cosine_similarity(sentences)
79
80
81
       # Segment sentences based on similarity
82
       segments = segment_sentences(sentences, cosine_sim, threshold)
83
84
       # Print segmented sentences
85
       print("\nSegmented Sentences:")
86
       print_segments(segments)
87
88
       # Save segments to a text file
       save_segments_to_file(segments, output_file)
89
90
91 # File paths
92 file_path = '/content/transcript (5).txt' # Replace with your file path
93 output_file = '/content/segmented_output.txt' # Output text file path
95 # Process the transcript, segment it, and save to a text file
96 process_transcript(file_path, threshold=0.15, output_file=output_file)
→ Sentences extracted:
    S1: so, sir, we know that India has seen a huge Revolution with digital payments.
    S2: we all thought that India is a place- at least the West thought- that India is a place where, uh, many people do not get a sc
    S3: that was the narrative some 30 years ago.
    S4: and not many are literate- people cannot read, um.
    S5: but then we have now shown that digital payments number one is India, while people thought that it wouldn't even come to top
    S6: I think, immediately after UPA, the next big revolution, personally, I think, is in education, and the complete homework for
    S7: sir, my question is: do you think ncrf plus NEP put together will be the next big revolution after UPA in India?
    S8: absolutely, and why I think so is because in education, the last policy came up many, many years ago- that was in 1986, which
    S9: so so many changes have happened in the real world.
    S10: so many changes have happened in the requirement of the industry, requirement of Manpower for the industry.
    S11: however, there were no corresponding changes which happened?
    S12: education system.
    S13: so, therefore, I feel that this was the right time when we brought in the education policy 2020, honorable prime minister, (
    S14: 2020 is a policy, the NP 2020 is a policy, and for implementing a policy, you need a framework.
    S15: now, why we call it a framework?
    S16: we call it a framework because this is very flexible.
    S17: this allows you all the Innovation, the way you educate your kids, you educate your students.
    S18: still, it provides you the basic guidelines, the, the framework, the outer layer it provides, and that layer is mostly the \epsilon
    S19: that is such an enabling layer that it has broken the shackles which were there in the education sector, right?
    S20: so, yes, it is a big Revolution and this is going to change the way we have been educating our kids and this will be Game Ch
    S21: so, sir, I think, um, uh, let's go with this example of, let's say, I started off living in a small 2bhk apartment M and I s
    S22: right, and one fine day, you came and you changed my kitchen completely.
    S23: I was using a bicycle, I moved to a scooter and a car and now you're asking me to fly and you're giving me an aircraft.
    S24: NEP sounds more like that for me.
    S25: how do I do the transition?
    S26: I fear that I will.
    S27: I will crash if I use a aeroplane without training.
    S28: I'm talking about all the teachers in the in the country, all the schools in the country.
    S29: we have been driving buses at Max.
    S30: now we should fly.
    S31: how do we do this?
    S32: okay, look at the requirement of the industry.
    S33: requirement of the industry has been moving very fast.
    S34: the technology is emerging every day and the industry is moving with that speed.
    S35: so when a student is coming out of your Institute and is going out in the market, he finds that whatever he has been taught
```

```
S36: when industry is moving that fast, when the requirement is moving that fast, don't you think it is important for us to chan
S37: yes, how long can we wait?
S38: yes, it will take a lot of effort for every one of us to adapt to this change.
S39: but this change is going to be not only beneficial, mhm, but also very facilitative for all of us, very liberating for all (
S40: this is going to be highly liberative and choice-based system.
S41: there are number of choices which are available to you, which are available to every student.
S42: yes, when we introduce a new system, we have to really create, create new things, create new ways of doing things, learn som
S43: but once we learn it, there is no limit to Innovation and creativity which this will bring.
S44: there's going to be a learning curve here.
S45: you mean, it's going to be difficult to fly a fighter, not really difficult to apply, because all of us we have that kind of
S46: only thing is that we were not translating our vision and Innovative Minds into the education sector, whereas we are applyir
S47: know we are, we are moving very fast.
S48: it's only education and I think the education sector is the smartest sector, which is very good at learning, and I'm I'm ver
S49: I can tell you that already a number of Institutions have adopted the NEP and ncrf to varying degrees and whereever they have
S50: so then, um, I have spoken to many academics.
S51: most of us do not understand NEP.
S52: let on ncrf, which is the next step on how to implement NEP.
S53: if I can request you to give me an elevator pitch for NEP and then an elevator pitch for ncrf, for the exclusive reason that
S54: okay, see, if I talk about one simple line on NP and ncf, that is, it is crediti of all learning.
S55: it allows for crediti of all learnings, whether in academics or in Skilling or in experiential learning, and all these three
```

```
1 import nltk
 2 from nltk.tokenize import sent_tokenize, word_tokenize
 3 from sklearn.feature extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 6
 7 # Download NLTK data
 8 nltk.download('punkt')
 9 nltk.download('stopwords')
10 from nltk.corpus import stopwords
11
12 def read_transcript(file_path):
13
      try:
           with open(file_path, 'r', encoding='utf-8') as file:
14
               transcript = file.read()
15
16
          return transcript
17
      except Exception as e:
18
          print(f"Error reading file: {e}")
19
           return None
20
21 def split_into_sentences(transcript):
22
      return sent tokenize(transcript)
23
24 def calculate cosine similarity(sentences):
25
      vectorizer = TfidfVectorizer()
26
       tfidf_matrix = vectorizer.fit_transform(sentences)
       cosine_sim = cosine_similarity(tfidf_matrix)
27
28
       return cosine sim
29
30 def segment_sentences(sentences, cosine_sim, threshold=0.5):
      visited = [False] * len(sentences)
31
32
       segments = []
33
       for i in range(len(sentences)):
          if not visited[i]:
34
35
               segment = [sentences[i]]
36
               visited[i] = True
               for j in range(i + 1, len(sentences)):
37
38
                   if not visited[j] and cosine_sim[i][j] >= threshold:
39
                       segment.append(sentences[j])
                       visited[j] = True
40
41
               segments.append(segment)
42
      return segments
43
44 def remove_stopwords(segment):
      stop_words = set(stopwords.words('english'))
45
46
       filtered words = []
47
       for sentence in segment:
48
           words = word tokenize(sentence)
49
           filtered_words.extend([word.lower() for word in words if word.isalnum() and word.lower() not in stop_words])
      return filtered words
50
51
52 def find keywords(filtered words):
53
      if len(filtered words) < 2:
           return None, None, 0 # Not enough words for comparison
54
55
56
      vectorizer = TfidfVectorizer()
      tfidf_matrix = vectorizer.fit_transform(filtered_words)
58
      cosine_sim = cosine_similarity(tfidf_matrix)
59
60
      max_sim = 0
61
       keyword_pair = (None, None)
       for i in range(len(filtered_words)):
```

```
63
            for j in range(i + 1, len(filtered_words)):
 64
                if cosine_sim[i][j] > max_sim:
 65
                    max_sim = cosine_sim[i][j]
                    keyword_pair = (filtered_words[i], filtered_words[j])
 66
 67
        return keyword_pair[0], keyword_pair[1], max_sim
 68
 69 def save_segments_to_csv(segments, output_file):
 70
        with pd.ExcelWriter(output_file) as writer:
            for idx, segment in enumerate(segments, start=1):
 71
 72
                filtered_words = remove_stopwords(segment)
 73
                word1, word2, max_sim = find_keywords(filtered_words)
 74
 75
                # Create a DataFrame for the segment
 76
                df = pd.DataFrame({
                     'Word 1': [word1] if word1 else [],
 77
                    'Word 2': [word2] if word2 else [],
 78
                     'Cosine Similarity': [max_sim] if word1 and word2 else [],
 79
                     'Keyword': [f"{word1}, {word2}"] if word1 and word2 else []
 80
 81
                })
 82
 83
                # Save each segment as a separate sheet
                df.to_excel(writer, sheet_name=f'Segment {idx}', index=False)
 84
 85
 86
        print(f"Segmented keywords saved to {output_file}")
 87
 88 def process transcript(file path, threshold=0.5, output file='segmented keywords.xlsx'):
 89
        transcript = read_transcript(file_path)
        if transcript is None:
 90
 91
            return
 92
        sentences = split_into_sentences(transcript)
 93
 94
        cosine_sim = calculate_cosine_similarity(sentences)
 95
        segments = segment sentences(sentences, cosine sim, threshold)
 96
 97
        save_segments_to_csv(segments, output_file)
 98
 99
        print("\nChosen Keywords for Each Segment:")
100
        for idx, segment in enumerate(segments, start=1):
101
            filtered_words = remove_stopwords(segment)
102
            word1, word2, max_sim = find_keywords(filtered_words)
103
            if word1 and word2:
104
                print(f"Segment {idx}: Keywords = {word1}, {word2} (Similarity: {max_sim:.2f})")
105
106
                print(f"Segment {idx}: Not enough data for keywords")
107
108 # File paths
109 file_path = '/content/transcript (5).txt' # Replace with your file path
110 output_file = '/content/segmented_keywords.xlsx' # Output Excel file path
111
112 # Run the process
113 process_transcript(file_path, threshold=0.1, output_file=output_file)
114
→ [nltk_data] Downloading package punkt to /root/nltk_data...
                 Package punkt is already up-to-date!
    [nltk data]
    [nltk_data] Downloading package stopwords to /root/nltk_data...
    [nltk_data] Package stopwords is already up-to-date!
    Segmented keywords saved to /content/segmented_keywords.xlsx
    Chosen Keywords for Each Segment:
    Segment 1: Keywords = sir, sir (Similarity: 1.00)
    Segment 2: Keywords = 30, 30 (Similarity: 1.00)
    Segment 3: Keywords = many, many (Similarity: 1.00)
    Segment 4: Keywords = many, many (Similarity: 1.00)
    Segment 5: Keywords = education, education (Similarity: 1.00)
    Segment 6: Keywords = brought, brought (Similarity: 1.00)
    Segment 7: Keywords = call, call (Similarity: 1.00)
    Segment 8: Keywords = allows, allows (Similarity: 1.00)
    Segment 9: Keywords = um, um (Similarity: 1.00)
    Segment 10: Keywords = car, car (Similarity: 1.00)
    Segment 11: Keywords = yes, yes (Similarity: 1.00)
    Segment 12: Keywords = know, know (Similarity: 1.00)
    Segment 13: Keywords = use, use (Similarity: 1.00)
    Segment 14: Keywords = level, level (Similarity: 1.00)
    Segment 15: Keywords = yes, yes (Similarity: 1.00)
    Segment 16: Keywords = going, going (Similarity: 1.00)
    Segment 17: Keywords = thing, thing (Similarity: 1.00)
    Segment 18: Keywords = number, number (Similarity: 1.00)
    Segment 19: Keywords = okay, okay (Similarity: 1.00)
    Segment 20: Keywords = students, students (Similarity: 1.00)
    Segment 21: Not enough data for keywords
    Segment 22: Keywords = single, single (Similarity: 1.00)
    Segment 23: Keywords = good, good (Similarity: 1.00)
    Segment 24: Keywords = curricular, curricular (Similarity: 1.00)
    Segment 25: Keywords = catch, catch (Similarity: 1.00)
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Segment 26: Keywords = short, short (Similarity: 1.00)
   Segment 27: Keywords = need, need (Similarity: 1.00)
   Segment 28: Keywords = important, important (Similarity: 1.00)
   Segment 29: Keywords = unable, unable (Similarity: 1.00)
   Segment 30: Keywords = syllabus, syllabus (Similarity: 1.00)
   Segment 31: Keywords = already, already (Similarity: 1.00)
Segment 32: Keywords = theory, theory (Similarity: 1.00)
   Segment 33: Keywords = student, student (Similarity: 1.00)
   Segment 34: Keywords = three, three (Similarity: 1.00)
   Segment 35: Keywords = talking, talking (Similarity: 1.00)
   Segment 36: Not enough data for keywords
   Segment 37: Not enough data for keywords
   Segment 38: Not enough data for keywords
   Segment 39: Not enough data for keywords
   Segment 40: Not enough data for keywords
   Segment 41: Keywords = project, project (Similarity: 1.00)
   Segment 42: Keywords = inside, inside (Similarity: 1.00)
   Segment 43: Keywords = think, think (Similarity: 1.00)
   Segment 44: Keywords = contain, contain (Similarity: 1.00)
   Segment 45: Keywords = really, really (Similarity: 1.00)
   Segment 46: Not enough data for keywords
   Segment 47: Not enough data for keywords
   Segment 48: Keywords = mhm, mhm (Similarity: 1.00)
   Segment 49: Not enough data for keywords
   Segment 50: Not enough data for keywords
   Segment 51: Not enough data for keywords
 2 from nltk.tokenize import sent_tokenize, word_tokenize
 3 from sklearn.feature_extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
 9 nltk.download('stopwords')
10 from nltk.corpus import stopwords
12 def read segmented file(file path):
13
           with open(file_path, 'r', encoding='utf-8') as file:
14
15
               content = file.read()
16
               \# Split the file content into segments based on a delimiter (e.g., "\n\n")
17
               segments = [segment.strip() for segment in content.split("\n\n") if segment.strip()]
18
           return segments
19
      except Exception as e:
           print(f"Error reading file: {e}")
20
21
           return None
22
23 def remove_stopwords(segment):
24
       stop_words = set(stopwords.words('english'))
25
       words = word tokenize(segment)
26
       return [word.lower() for word in words if word.isalnum() and word.lower() not in stop_words]
27
28 def calculate_word_cosine_similarity(filtered_words):
29
       if len(filtered_words) < 2:</pre>
           return None, None, 0, None # Not enough words for comparison
30
31
32
       vectorizer = TfidfVectorizer()
      tfidf_matrix = vectorizer.fit_transform(filtered_words)
33
34
       cosine_sim = cosine_similarity(tfidf_matrix)
35
       max_sim = 0
36
37
       keyword pair = (None, None)
38
      for i in range(len(filtered_words)):
39
           for j in range(i + 1, len(filtered_words)):
40
               if cosine_sim[i][j] > max_sim:
41
                   max_sim = cosine_sim[i][j]
42
                   keyword_pair = (filtered_words[i], filtered_words[j])
43
       return keyword_pair[0], keyword_pair[1], max_sim, cosine_sim
44
45
46 def save_word_similarity_to_excel(cosine_sim, filtered_words, sheet_name, writer):
47
      if cosine_sim is not None:
48
           df = pd.DataFrame(cosine_sim, index=filtered_words, columns=filtered_words)
49
           df.to excel(writer, sheet name=sheet name)
50
51
           df = pd.DataFrame(columns=['Info'])
52
           df.loc[0] = ["Not enough words for comparison"]
           df.to_excel(writer, sheet_name=sheet_name, index=False)
54
55 def save_keywords_summary_to_csv(keywords, output_file):
       summary_df = pd.DataFrame(keywords, columns=['Segment', 'Word 1', 'Word 2', 'Cosine Similarity', 'Keyword'])
56
57
       summary_df.to_csv(output_file, index=False)
       print(f"Keywords summary saved to {output_file}")
58
```

```
59
 60 def process segments(file path, output excel='segment word similarity.xlsx', summary csv='segment keywords summary.csv'):
         segments = read_segmented_file(file_path)
 61
         if segments is None:
 62
 63
              return
 64
 65
        keywords_summary = []
 66
 67
         with pd.ExcelWriter(output_excel) as writer:
              for idx, segment in enumerate(segments, start=1):
 68
                  # Remove stopwords
 69
 70
                  filtered_words = remove_stopwords(segment)
 71
 72
                  # Calculate cosine similarity between words
                  word1, word2, max_sim, cosine_sim = calculate_word_cosine_similarity(filtered_words)
 73
 74
 75
                  # Save word similarity matrix for each segment to Excel
                  save word similarity to excel(cosine sim, filtered words, f'Segment {idx}', writer)
 76
 77
 78
                  # Prepare summary data
                  if word1 and word2:
 79
                       keyword = f"{word1}, {word2}"
 80
                       keywords_summary.append([f"Segment {idx}", word1, word2, max_sim, keyword])
 81
 82
                  else:
 83
                       keywords_summary.append([f"Segment {idx}", "N/A", "N/A", 0, "N/A"])
 84
 85
         # Save summary of keywords to CSV
        save_keywords_summary_to_csv(keywords_summary, summary_csv)
 86
 87
 88
         # Print chosen keywords for each segment
        print("\nChosen Keywords for Each Segment:")
 89
 90
        for row in keywords_summary:
 91
             print(f"{row[0]}: Keywords = {row[4]} (Similarity: {row[3]:.2f})")
 92
 93 # File paths
 94 segmented_file_path = '/content/segmented_output.txt'  # Replace with your segmented text file path 95 output_excel = '/content/segment_word_similarity.xlsx'  # Excel file for word similarity matrices 96 summary_csv = '/content/segment_keywords_summary.csv'  # CSV file for keywords summary
 99 process segments(segmented file path, output excel=output excel, summary csv=summary csv)
100
→ [nltk_data] Downloading package punkt to /root/nltk_data...
     [nltk_data] Package punkt is already up-to-date!
     [nltk data] Downloading package stopwords to /root/nltk data...
     [nltk_data] Package stopwords is already up-to-date!
     Keywords summary saved to /content/segment_keywords_summary.csv
     Chosen Keywords for Each Segment:
     Segment 1: Keywords = sir, sir (Similarity: 1.00)
Segment 2: Keywords = thought, thought (Similarity: 1.00)
     Segment 3: Keywords = 30, 30 (Similarity: 1.00)
     Segment 4: Keywords = think, think (Similarity: 1.00)
     Segment 5: Keywords = however, however (Similarity: 1.00)
     Segment 6: Keywords = education, education (Similarity: 1.00)
     Segment 7: Keywords = 2020, 2020 (Similarity: 1.00)
     Segment 8: Keywords = call, call (Similarity: 1.00)
     Segment 9: Keywords = way, way (Similarity: 1.00)
     Segment 10: Keywords = provides, provides (Similarity: 1.00)
     Segment 11: Keywords = uh, uh (Similarity: 1.00)
     Segment 12: Keywords = N/A (Similarity: 0.00)
     Segment 13: Keywords = saying, saying (Similarity: 1.00)
     Segment 14: Keywords = nep, nep (Similarity: 1.00)
     Segment 15: Keywords = say, say (Similarity: 1.00)
     Segment 16: Keywords = fact, fact (Similarity: 1.00)
     Segment 17: Keywords = without, without (Similarity: 1.00)
     Segment 18: Keywords = talking, talking (Similarity: 1.00)
     Segment 19: Keywords = N/A (Similarity: 0.00)
Segment 20: Keywords = okay, okay (Similarity: 1.00)
     Segment 21: Keywords = student, student (Similarity: 1.00)
     Segment 22: Keywords = yes, yes (Similarity: 1.00)
     Segment 23: Keywords = yes, yes (Similarity: 1.00)
     Segment 24: Keywords = new, new (Similarity: 1.00)
     Segment 25: Keywords = going, going (Similarity: 1.00)
     Segment 26: Keywords = minds, minds (Similarity: 1.00)
     Segment 27: Keywords = already, already (Similarity: 1.00)
     Segment 28: Keywords = um, um (Similarity: 1.00)
     Segment 29: Keywords = okay, okay (Similarity: 1.00)
     Segment 30: Keywords = already, already (Similarity: 1.00)
Segment 31: Keywords = interdisciplinarity, interdisciplinarity (Similarity: 1.00)
     Segment 32: Keywords = single, single (Similarity: 1.00)
     Segment 33: Keywords = good, good (Similarity: 1.00)
     Segment 34: Keywords = curricular, curricular (Similarity: 1.00)
     Segment 35: Keywords = learning, learning (Similarity: 1.00)
Segment 36: Keywords = multiple, multiple (Similarity: 1.00)
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Segment 37: Keywords = three, three (Similarity: 1.00)
      Segment 38: Keywords = short, short (Similarity: 1.00)
       Segment 39: Keywords = think, think (Similarity: 1.00)
      Segment 40: Keywords = infrastructure, infrastructure (Similarity: 1.00)
       Segment 41: Keywords = N/A (Similarity: 0.00)
      Segment 42: Keywords = feel, feel (Similarity: 1.00)
      Segment 43: Keywords = important, important (Similarity: 1.00)
      Segment 44: Keywords = imagine, imagine (Similarity: 1.00)
      Segment 45: Keywords = unable, unable (Similarity: 1.00)
      Segment 46: Keywords = design, design (Similarity: 1.00)
      Segment 47: Keywords = computer, computer (Similarity: 1.00)
      Segment 48: Keywords = courses, courses (Similarity: 1.00)
      Segment 49: Keywords = 50, 50 (Similarity: 1.00)
       Segment 50: Keywords = keep, keep (Similarity: 1.00)
       Segment 51: Kevwords = N/A (Similarity: 0.00)
 1 import nltk
 2 from nltk.tokenize import word_tokenize
  3 import re
 4 import pandas as pd
 6 # Download NLTK data if not already available
 7 nltk.download('punkt')
  8 nltk.download('stopwords')
 9 from nltk.corpus import stopwords
10
11 # Define filler words to remove
12 FILLER_WORDS = {'umm', 'uh', 'oh', 'okay', 'like', 'you know', 'actually', 'basically', 'literally', 'well', 'so', 'just', 'i mean'
13
14 def read segmented file(file path):
15
             ""Read segmented text file and split into segments."""
16
                  with open(file_path, 'r', encoding='utf-8') as file:
17
18
                         content = file.read()
19
                         # Split the file content into segments based on double newlines
20
                         segments = [segment.strip() for segment in content.split("\n\n") if segment.strip()]
21
                  return segments
22
           except Exception as e:
23
                  print(f"Error reading file: {e}")
                  return None
25
26 def clean text(segment):
27
            """Remove stopwords, fillers, and dates from a segment."""
28
           stop_words = set(stopwords.words('english'))
29
           # Remove dates (e.g., 12/03/2023, March 12, 2023)
30
31
           segment = re.sub(r'\b(\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/-]\d\{1,2\}[/
32
33
           # Tokenize and clean words
34
           words = word_tokenize(segment)
35
           filtered words = [
36
                  word.lower() for word in words
37
                  if word.isalnum() and word.lower() not in stop_words and word.lower() not in FILLER_WORDS
38
           1
39
           return ' '.join(filtered_words)
40
41 def save_to_csv(segments, cleaned_segments, output_file):
42
           """Save original and cleaned segments to a CSV file."""
           df = pd.DataFrame({
43
44
                   'Original Segment': segments,
45
                   'Cleaned Segment (No Stopwords or Fillers)': cleaned_segments
46
47
           df.to_csv(output_file, index=False)
48
           print(f"Cleaned segments saved to {output_file}")
49
50 def process_segments(file_path, output_csv='cleaned_segments.csv'):
51
              ""Process the segmented text file.""
           segments = read_segmented_file(file_path)
52
           if segments is None:
53
54
                 return
55
           cleaned_segments = [clean_text(segment) for segment in segments]
56
57
           save_to_csv(segments, cleaned_segments, output_csv)
58
59
           # Print a preview of cleaned segments
           print("\nPreview of Cleaned Segments:")
60
61
           for idx, (orig, clean) in enumerate(zip(segments, cleaned_segments), start=1):
62
                  print(f"\nSegment {idx} (Original): {orig}")
63
                  print(f"Segment {idx} (Cleaned): {clean}")
64
65 # File paths
66 segmented_file_path = '/content/segmented_output.txt' # Replace with your segmented text file path
67 output_csv = '/content/cleaned_segments.csv' # CSV file for cleaned segments
```

20 21

22

23

```
69 # Run the process
70 process segments(segmented file path, output csv=output csv)
Cleaned segments saved to /content/cleaned_segments.csv
    Preview of Cleaned Segments:
    Segment 1 (Original): Segment 1:
     - so, sir, we know that India has seen a huge Revolution with digital payments.
     - but then we have now shown that digital payments number one is India, while people thought that it wouldn't even come to top !
     - sir, my question is: do you think norf plus NEP put together will be the next big revolution after UPA in India?
     - know we are, we are moving very fast.
     - wonderful, sir.
     - we all know a lot of scandals.
     - so that has been provided here.
     - not only that India is grappling with this problem.
    Segment 1 (Cleaned): segment 1 sir know india seen huge revolution digital payments shown digital payments number one india peopl
    Segment 2 (Original): Segment 2:
     - we all thought that India is a place- at least the West thought- that India is a place where, uh, many people do not get a squ
     - and not many are literate- people cannot read, um.
     - how do we do this?
     - you have place for everything.
     - okay, you look at the kind of the, the requirement of infrastructure India has today.
     - so here is where I have um, um, um thought, with some inhibitions, about the entire setup, where you are simply assuming a lot
     - so that I know the student is learning, the student knows that here is a genuine place and the person there also knows that we
     - the university is not giving me what I thought it would.
     - we have, uh, which is not appearing at the surface level, which is the student teacher ratio.
     - it is uh, it is really uh, against the students, right, right, already, it's already so, but then, uh, the colleges should not
     - so here's where I think there's a foot for Thought, where I will, uh, try to slightly disagree.
     - I I see that as as this is a wonderful thought, but I think the students wants to see those short videos not in these alignmer
     - that is where the problem lies.
     - that that is where the problem lies.
     - that is, the hecaton is is all about.
     - that's a very good thought.
     - why is it that we have not thought about all these things worldwide?
     - so for why see why this was not not even thought about?
     - we did that, mhm, and that has been done not only once but at least twice, multiple times.
     - that is the framework.
     - it gives me some non-trivial money, at least enough for me to eat and stay in a place.
    Segment 2 (Cleaned): segment 2 thought india least west india place many people get square meal right many people read um place @
    Segment 3 (Original): Segment 3:
     - that was the narrative some 30 years ago.
     - absolutely, and why I think so is because in education, the last policy came up many, many years ago- that was in 1986, which
     - I was trying to answer.
     - that was the second part which I wanted to answer.
     - it was.
     - Manan is going to be 30 seconds only.
     - and even in that 7 and a half minutes, that concept is broken into three parts of 2 minutes each, followed by 30 Seconds of sc
     - earlier this was not there.
    Segment 3 (Cleaned): segment 3 narrative 30 years ago absolutely think education last policy came many many years 1986 slightly t
    Segment 4 (Original): Segment 4:
     - I think, immediately after UPA, the next big revolution, personally, I think, is in education, and the complete homework for 1
     - so so many changes have happened in the real world.
     - so many changes have happened in the requirement of the industry, requirement of Manpower for the industry.
     - so, therefore, I feel that this was the right time when we brought in the education policy 2020, honorable prime minister, dec
     - we call it a framework because this is very flexible.
      - that is such an enabling layer that it has broken the shackles which were there in the education sector, right?
    4
       1 import json
 2 import re
 4 def load transcript from file(file path):
 5
 6
       Loads the transcript from a file.
 7
       Args:
 8
          file_path (str): Path to the transcript file.
 9
       Returns:
          list: List of dictionaries with 'start', 'end', and 'text' keys.
10
11
12
           with open(file_path, "r", encoding="utf-8") as file:
13
14
               if file_path.endswith(".json"):
15
                   transcript = json.load(file)
16
               else:
                   # For plain text files, assume each line is in the format: [start] - [end]: [text]
17
18
                   transcript = []
19
                   for line in file:
```

"start": float(start),

transcript.append({

start, end, text = match.groups()

if match:

 $match = re.match(r"(\d+\.\d+) - (\d+\.\d+): (.+)", line.strip())$

```
25
                                "end": float(end),
                                "text": text
26
27
                            })
28
               return transcript
29
       except Exception as e:
30
           print(f"Error loading transcript: {e}")
31
32
33 def save_transcript_with_timestamps(transcript, output_path="transcript_with_timestamps.txt"):
34
35
       Saves the transcript with timestamps to a text file.
36
       Args:
           transcript (list): List of dictionaries with 'start', 'end', and 'text'.
37
38
           output_path (str): The path to save the output file.
39
40
       with open(output_path, "w", encoding="utf-8") as file:
41
           for segment in transcript:
               file.write(f"{segment['start']} - {segment['end']}: {segment['text']}\n")
42
43
       print(f"Transcript with timestamps saved to {output_path}")
44
45 # Example usage
46 if __name__ == "__main__":
47
       # Ask the user for the transcript file path
48
       transcript_path = input("Enter the path to the transcript file: ")
49
       output_path = input("Enter the path to save the transcript with timestamps (default: transcript_with_timestamps.txt): ") or "transcript_with_timestamps.txt): ")
50
51
       # Load the transcript from the file
       transcript = load_transcript_from_file(transcript_path)
52
53
       if not transcript:
           print("Failed to load transcript. Exiting.")
54
55
           exit()
56
57
       # Print the transcript with timestamps
       print("\nTranscript with Timestamps:")
58
59
       for segment in transcript:
60
           print(f"{segment['start']} - {segment['end']}: {segment['text']}")
61
62
       # Save the transcript with timestamps to a file
63
       save transcript with timestamps(transcript, output path)
Finter the path to the transcript file: <a href="https://youtu.be/sK8SILOM371">https://youtu.be/sK8SILOM371</a>
    Enter the path to save the transcript with timestamps (default: transcript_with_timestamps.txt):
    Error loading transcript: [Errno 2] No such file or directory: 'https://youtu.be/sK8SILOM37I
    Failed to load transcript. Exiting.
    Transcript with Timestamps:
    TypeError
                                               Traceback (most recent call last)
    <ipython-input-31-41113dfd0e0a> in <cell line: 0>()
         57
                # Print the transcript with timestamps
         58
                print("\nTranscript with Timestamps:")
                for segment in transcript:
         60
                    print(f"{segment['start']} - {segment['end']}: {segment['text']}")
    TypeError: 'NoneType' object is not iterable
    1
  1 import re
  2 import urllib.parse
  3 import requests
  4 from youtube_transcript_api import YouTubeTranscriptApi
  5 from pytube import YouTube
  6 import speech_recognition as sr
  7 from pydub import AudioSegment
  8 import os
  9 import yt_dlp
 10 def extract_video_id(video_url):
 11
 12
        Extracts the YouTube video ID from various URL formats.
 13
 14
        parsed_url = urllib.parse.urlparse(video_url)
        query_params = urllib.parse.parse_qs(parsed_url.query)
 15
 16
 17
        if "v" in query_params:
            return query_params["v"][0]
 18
 19
 20
        match = re.search(r"(youtu\.be/|youtube\.com/embed/|youtube\.com/shorts/)([\w-]+)", video_url)
 21
        if match:
 22
            return match.group(2)
 23
 24
        return None
```

```
26 def download_audio(video_url):
27
       Downloads the audio using yt-dlp with cookies and returns the file path.
28
29
30
       try:
31
           ydl_opts = {
                'format': 'bestaudio/best',
 32
                'outtmpl': 'audio.%(ext)s',
 33
                'cookiefile': '/content/cookies (2).txt', # Use the exported cookies
 34
 35
                'postprocessors': [{
36
                    'key': 'FFmpegExtractAudio',
                    'preferredcodec': 'mp3',
 37
                    'preferredquality': '192',
 38
39
               }],
40
           }
41
           with yt_dlp.YoutubeDL(ydl_opts) as ydl:
                info = ydl.extract_info(video_url, download=True)
 42
                return "audio.mp3"
43
 44
       except Exception as e:
45
           return f"Error downloading audio: {str(e)}"
46
 47 def convert_audio_to_wav(audio_file):
48
49
       Converts the downloaded MP3 audio to WAV format using pydub.
50
       wav_file = "audio.wav"
51
 52
       try:
           AudioSegment.from_mp3(audio_file).export(wav_file, format="wav")
53
54
           return wav_file
 55
       except Exception as e:
           return f"Error converting to WAV: {str(e)}"
56
57
 58 def transcribe audio(audio path, chunk length=30):
59
 60
       Splits audio into smaller chunks and transcribes each chunk separately.
61
       Args:
62
            audio_path (str): Path to the audio file.
 63
           chunk_length (int): Length of each chunk in seconds (default: 30).
 64
       Returns:
       list: List of dictionaries containing transcribed text and timestamps.
 65
66
 67
       recognizer = sr.Recognizer()
       audio = AudioSegment.from_wav(audio_path)
 68
69
       total duration = len(audio) / 1000 # Convert to seconds
 70
       transcribed_segments = []
 71
       print("Transcribing audio in chunks...")
72
 73
 74
       # Split and transcribe audio in chunks
75
        for start in range(0, int(total_duration), chunk_length):
 76
            end = min(start + chunk_length, int(total_duration))
 77
            chunk = audio[start * 1000:end * 1000] # Extract chunk in milliseconds
 78
            chunk.export("chunk.wav", format="wav") # Save chunk temporarily
79
 20
           with sr.AudioFile("chunk.wav") as source:
 81
                    audio_data = recognizer.record(source)
82
 83
                    text = recognizer.recognize_google(audio_data)
 84
                    transcribed_segments.append({
85
                        "start": start,
                        "end": end,
                        "text": text
 87
88
                    })
 89
                except sr.UnknownValueError:
90
                    transcribed_segments.append({
91
                        "start": start,
92
                        "end": end,
93
                        "text": "[Unintelligible]"
 94
                    })
95
                except sr.RequestError as e:
 96
                    return f"Error with the speech recognition service: {str(e)}"
 97
       os.remove("chunk.wav") # Clean up temporary chunk file
98
99
       return transcribed_segments
100
101 def get_transcript_unlisted(video_url):
102
       Tries to fetch the transcript using youtube_transcript_api first,
103
104
        then falls back to downloading and transcribing audio if necessary.
105
106
       video_id = extract_video_id(video_url)
        if not video_id:
```

```
108
            return "Invalid YouTube URL."
109
        # Try to fetch transcript using youtube_transcript_api
110
111
            transcript = YouTubeTranscriptApi.get_transcript(video_id)
112
113
            # Add 'end' time to each segment
114
            for segment in transcript:
                segment["end"] = segment["start"] + segment["duration"]
115
            return transcript # Return transcript with timestamps
116
117
        except:
118
            print("Transcript not available via API, attempting audio transcription...")
119
        # Download and transcribe audio if no transcript is available
120
121
        audio_file = download_audio(video_url)
        if "Error" in audio file:
122
123
            return audio_file
124
        wav_file = convert_audio_to_wav(audio_file)
125
126
        if "Error" in wav_file:
127
            return wav_file
128
129
        transcription = transcribe_audio(wav_file)
130
131
        # Cleanup temporary files
132
        os.remove(audio_file)
133
        os.remove(wav file)
134
135
        return transcription
136
137 def save_transcript_to_file(transcript, filename="transcript.txt"):
138
139
        Saves the transcript to a text file.
140
        Args:
            transcript (list or str): The transcript to save.
141
            filename (str): The name of the output file.
142
143
144
        with open(filename, "w", encoding="utf-8") as file:
145
            if isinstance(transcript, list):
                for segment in transcript:
146
147
                     file.write(f"{segment['start']} - {segment['end']}: {segment['text']}\n")
148
            else:
149
                file.write(transcript)
150
        print(f"Transcript saved to {filename}")
151
152 # Example usage
153 if __name__ == "_
                      _main__":
        video url = input("Enter the YouTube video URL: ")
154
        transcript = get_transcript_unlisted(video_url)
155
156
157
        if isinstance(transcript, list):
158
            print("\nTranscript with Timestamps:")
159
            for segment in transcript:
160
                 print(f"{segment['start']} - {segment['end']}: {segment['text']}")
161
162
            print("\nTranscript:\n", transcript)
163
164
        # Save transcript to a text file
165
        save_transcript_to_file(transcript, "transcript.txt")
Finter the YouTube video URL: <a href="https://youtu.be/sK8SILOM371">https://youtu.be/sK8SILOM371</a>
    Transcript not available via API, attempting audio transcription...
    [youtube] Extracting URL: <a href="https://youtu.be/sK8SILOM37I">https://youtu.be/sK8SILOM37I</a>
     [youtube] sK8SILOM37I: Downloading webpage
     [youtube] sK8SILOM37I: Downloading tv client config
     [youtube] sK8SILOM37I: Downloading player f6e09c70
     [youtube] sK8SILOM37I: Downloading tv player API JSON
    [info] sK8SILOM37I: Downloading 1 format(s): 251
     [download] Destination: audio.webm
     [download] 100% of 39.37MiB in 00:00:01 at 31.86MiB/s
    [ExtractAudio] Destination: audio.mp3
    Deleting original file audio.webm (pass -k to keep)
    Transcribing audio in chunks...
    Transcript with Timestamps:
    0 - 30: so sorry we know that India has seen a huge Revolution with digital payments we all thought that India is a place at leas
    30 - 60: I think immediately after you play the next big revolution personally I think is an education and the complete homework
    60 - 90: do you think ncrf plus any people together will be the next big revolution after up in India absolutely and why I think
    90 - 120: how many changes have happened in the real world so many changes have happened in the requirement of the industry requi
    120 - 150: July 2020 and we recently celebrated the 4th anniversary of NP 2020 ncrf has been brought to implement the intent of 2
    150 - 180: this allows you all the Innovation the way you educate your kids you educate your students still it provides you the t
    180 - 210: broken the shackles of which were there in the education sector right so yes it is a big Revolution and this is going
    210 - 240: pull up my kitchen to add to my taste buds in a way that it's convenient for me and one fine day you came and you char
    240 - 270: we have been driving buses at Max now we should fly how do we do this look at the requirement of the industry requirem
    270 - 300: link that whatever he has been taught has no relevance to the real life world when industry is moving that fast when 1
```

```
300 - 330: will you be not only beneficial but also very facilitated for all of us very liberating for all of us this is going to
    330 - 360: new things create new ways of doing things learn something new but once we learn it there is no limit to Innovation ar
    360 - 390: creating our vision and Innovative Minds into the education sector where is we are applying it elsewhere everywhere el
    390 - 420: to be fun for everyone and I can I can tell you that already a number of Institutions have adopted the any pain and CF
    420 - 450: next step on how to implement an AP if I can request you to give me an elevator pitch for an EP and then an elevator p
    450 - 480: it allows for creditor of all learnings weather in academics orange killing or an experiential learning and all these
    480 - 510: and people who are already skilled or already in the professional area not there the experiential learning would play
    510 - 540: increase of technology which has been created by single Department good question so therefore all of us we have to wor
    540 - 570: all kinds of learning are being contractors including learning of soft skills employability skills life skills your ha
    570 - 600: go out it's all very flexible so that there's no Dropout there's no Dropout so these three things coupled with use of
    600 - 630: I want my son to be an engineer don't you think if we create a give me five approach to Credit Systems everybody will
    630 - 660: turn off infrastructure India has today we created in last 1775 years we are going to double that infrastructure in n€
    660 - 690: more number of other branches even liberal arts social sciences if I want to be an award Society I would need a proper
    690 - 720: have you already seen the Fallout of this know you can see the photo you can see how many Engineers are there for Desi
    720 - 750: [Unintelligible]
    750 - 780: any of the new technology machines current any laser-based machines any automated operating machines robotic operation
    780 - 810: robotic process and that is killing is equally important and this is important in multiple areas and therefore multidi
    810 - 840: me and you want to know design a VTech in CSC syllabus or be taking AI syllabus that is Nip complaint under the ncrf i
    840 - 870: are you teaching Teddy teaching Terry is not sufficient if you want the student to really understand and reply that co
    870 - 900: those horses are skill bass courses you divide every subject into 30 and its application how do you apply the theory \epsilon
    900 - 930: who is learning which is happening which which you are going through so then this looks like let's say my student stay
    930 - 960: extension of BSC physics or BSC chemistry and you give him the actual knowledge of computer science right in the first
    960 - 990: that's unbelievable so that 50% of the time which means two full years and a btech program a person can stay outside 1
    990 - 1020: are you learning outcomes and their alignment with the overall curricular structure and then once it comes back we ha
    1020 - 1050: he gets the credits okay so here is where I have talked with some inhibitions about the entire setup where you are
    1050 - 1080: write although we can keep that a check it is not easy for us to keep some zones green some zones red operational co
    1080 - 1110: what is the guarantee that the student is learning in the campus is there a is there an accident on some kind of a {
    1110 - 1140: either online or with some time stamps it is it is being documented know what time is done and CVT has videographed
    1140 - 1170: she claims that all right he is a good technician and he can repair any kind of car so she prepares you open the BMV
    1170 - 1200: Julie appointed by the awarding body which Awards the certificate and then that video is kept forever so you imagine
    1200 - 1230: who is giving us I think that's a nail on the head where I think we all should pass for a moment and then think is (
 1 pip install yt-dlp
   Collecting yt-dlp
      Downloading yt_dlp-2025.2.19-py3-none-any.whl.metadata (171 kB)
                                                 171.9/171.9 kB 3.1 MB/s eta 0:00:00
    Downloading yt_dlp-2025.2.19-py3-none-any.whl (3.2 MB)
                                                3.2/3.2 MB 36.3 MB/s eta 0:00:00
    Installing collected packages: vt-dlp
    Successfully installed vt-dlp-2025.2.19
 1 pip install voutube-transcript-api
Street Collecting youtube-transcript-api
      Downloading youtube_transcript_api-0.6.3-py3-none-any.whl.metadata (17 kB)
    Requirement already satisfied: defusedxml<0.8.0,>=0.7.1 in /usr/local/lib/python3.11/dist-packages (from youtube-transcript-api) (0
    Requirement already satisfied: requests in /usr/local/lib/python3.11/dist-packages (from youtube-transcript-api) (2.32.3)
    Requirement already satisfied: charset-normalizer<4,>=2 in /usr/local/lib/python3.11/dist-packages (from requests->youtube-transcrip
    Requirement already satisfied: idna<4,>=2.5 in /usr/local/lib/python3.11/dist-packages (from requests->youtube-transcript-api) (3.16
    Requirement already satisfied: urllib3<3,>=1.21.1 in /usr/local/lib/python3.11/dist-packages (from requests->youtube-transcript-api
    Requirement already satisfied: certifi>=2017.4.17 in /usr/local/lib/python3.11/dist-packages (from requests->youtube-transcript-api
    Downloading youtube_transcript_api-0.6.3-py3-none-any.whl (622 kB)
                                                622.3/622.3 kB 9.6 MB/s eta 0:00:00
    Installing collected packages: youtube-transcript-api
    Successfully installed youtube-transcript-api-0.6.3
 1 pip install SpeechRecognition
→ Collecting SpeechRecognition
      Downloading SpeechRecognition-3.14.1-py3-none-any.whl.metadata (31 kB)
    Requirement already satisfied: typing-extensions in /usr/local/lib/python3.11/dist-packages (from SpeechRecognition) (4.12.2)
    Downloading SpeechRecognition-3.14.1-py3-none-any.whl (32.9 MB)
                                                32.9/32.9 MB 34.0 MB/s eta 0:00:00
    Installing collected packages: SpeechRecognition
    Successfully installed SpeechRecognition-3.14.1
 1 pip install pydub
→ Collecting pydub
      Downloading pydub-0.25.1-py2.py3-none-any.whl.metadata (1.4 kB)
    Downloading pydub-0.25.1-py2.py3-none-any.whl (32 kB)
    Installing collected packages: pydub
    Successfully installed pydub-0.25.1
 1 pip install pytube
→ Collecting pytube
      Downloading pytube-15.0.0-py3-none-any.whl.metadata (5.0 kB)
    Downloading pytube-15.0.0-py3-none-any.whl (57 kB)
                                                57.6/57.6 kB 3.2 MB/s eta 0:00:00
    Installing collected packages: pvtube
    Successfully installed pytube-15.0.0
```

```
1 import nltk
 2 from nltk.tokenize import sent_tokenize
 3 from sklearn.feature extraction.text import TfidfVectorizer
 4 from sklearn.metrics.pairwise import cosine_similarity
 5 import pandas as pd
 7 # Download NLTK data
 8 nltk.download('punkt')
10 def read_transcript(file_path):
11
      try:
           with open(file_path, 'r', encoding='utf-8') as file:
12
13
               transcript = file.read()
          return transcript
14
15
      except Exception as e:
16
          print(f"Error reading file: {e}")
           return None
17
18
19 def split into sentences(transcript):
20
      return sent_tokenize(transcript)
22 def calculate_cosine_similarity(sentences):
23
       vectorizer = TfidfVectorizer()
      tfidf matrix = vectorizer.fit transform(sentences)
24
      cosine_sim = cosine_similarity(tfidf_matrix)
25
26
      return cosine_sim
27
28 def segment_sentences(sentences, cosine_sim, threshold=0.5, min_sentences=5):
29
      visited = [False] * len(sentences)
      segments = []
30
31
      for i in range(len(sentences)):
32
          if not visited[i]:
33
34
               segment = [sentences[i]]
35
               visited[i] = True
36
37
               for j in range(i + 1, len(sentences)):
                   if not visited[j] and cosine_sim[i][j] >= threshold:
38
39
                       segment.append(sentences[j])
                       visited[j] = True
40
41
               segments.append(segment)
42
43
44
      # Merge smaller segments
45
      merged segments = []
46
      temp_segment = []
47
48
      for segment in segments:
49
           temp_segment.extend(segment)
50
           if len(temp_segment) >= min_sentences:
51
               merged_segments.append(temp_segment)
52
               temp_segment = []
53
54
      if temp_segment:
55
           if merged segments:
56
               merged_segments[-1].extend(temp_segment)
57
58
               merged_segments.append(temp_segment)
59
60
      return merged_segments
61
62 def print_segments(segments):
       for idx, segment in enumerate(segments, start=1):
63
64
           print(f"\nSegment {idx}:")
65
           for sentence in segment:
               print(f" - {sentence}")
66
67
68 def save_segments_to_file(segments, output_file):
69
70
           with open(output_file, 'w', encoding='utf-8') as file:
71
               for idx, segment in enumerate(segments, start=1):
                   file.write(f"Segment {idx}:\n")
72
73
                   for sentence in segment:
                       file.write(f" - {sentence}\n")
74
75
                   file.write("\n")
           print(f"Segmented output saved to {output_file}")
76
77
      except Exception as e:
78
           print(f"Error saving file: {e}")
79
80 def process_transcript(file_path, threshold=0.5, min_sentences=5, output_file='segmented_output.txt'):
      transcript = read_transcript(file_path)
```

```
82
       if transcript is None:
83
           return
84
85
      sentences = split_into_sentences(transcript)
86
      print("Sentences extracted:")
87
      for i, sentence in enumerate(sentences):
88
           print(f"S{i + 1}: {sentence}")
89
90
      cosine_sim = calculate_cosine_similarity(sentences)
91
92
       segments = segment_sentences(sentences, cosine_sim, threshold, min_sentences)
93
       print("\nSegmented Sentences:")
94
95
       print_segments(segments)
96
97
       save_segments_to_file(segments, output_file)
98
99 file_path = '/content/transcript.txt' # Replace with your file path
100 output_file = '/content/segmented_output.txt'
101 process_transcript(file_path, threshold=0.15, min_sentences=5, output_file=output_file)
```