

CODE

app.py

```
import os
```

```
import datetime
```

```
import nltk
```

```
import time
```

```
import pandas as pd
```

```
import streamlit as st
```

```
from summarizer import TextSummarizer
```

```
import database as db
```

```
# Explicitly set the data path for NLTK
```

```
nltk.data.path.append('/Users/suryakandikattu/nltk_data')
```

```
# Ensure necessary NLTK resources are downloaded, explicitly download punkt
```

```
try:
```

```
    nltk.data.find('tokenizers/punkt')
```

```
    print("Punkt resource found!")
```

```
except LookupError:
```

```
    print("Punkt resource not found. Downloading...")
```

```
    nltk.download('punkt')
```

```
# Explicitly download 'averaged_perceptron_tagger'
```

```
try:
```

```
    nltk.data.find('taggers/averaged_perceptron_tagger')
```

```
    print("Averaged Perceptron Tagger found!")
```

```
except LookupError:
```

```

print("Averaged Perceptron Tagger not found. Downloading...")

nltk.download('averaged_perceptron_tagger')


# Set page configuration
st.set_page_config(
    page_title="Text Summarizer",
    page_icon="📄",
    layout="wide"
)


# Initialize the summarizer
summarizer = TextSummarizer()


def main():
    # Create sidebar navigation
    page = st.sidebar.selectbox("Navigation", ["New Summary", "History"])

    if page == "New Summary":
        create_summary_page()
    else:
        view_history_page()


def create_summary_page():
    st.title("NLP Text Summarization")

    st.write("Upload or paste text to generate a concise summary using NLP techniques.")

    # File upload option

```

```

uploaded_file = st.file_uploader("Upload a text file", type=["txt", "csv", "md"])

# Text input option
text_input = st.text_area("Or paste your text here:", height=250)

# Add title field for the summary
summary_title = st.text_input("Summary Title:", "Untitled Summary")

# Parameters for summarization
st.sidebar.header("Summarization Parameters")

# Summary length parameter (sentence count or percentage)
length_option = st.sidebar.radio("Summary Length Type:", ["Sentence Count", "Percentage"])

if length_option == "Sentence Count":
    summary_length = st.sidebar.slider("Number of sentences:", min_value=1, max_value=20,
value=5)
    summary_percentage = None
else:
    summary_percentage = st.sidebar.slider("Summary Percentage:", min_value=10, max_value=90,
value=30)
    summary_length = None

# Algorithm selection
algorithm = st.sidebar.selectbox(
    "Summarization Algorithm:",
    ["TextRank", "Frequency-based", "Latent Semantic Analysis"]
)

```

```

# Focus parameter (what type of sentences to prioritize)

focus = st.sidebar.multiselect(

    "Focus on:",

    ["Key entities", "Action sentences", "Quotations", "Statistics"],

    default=["Key entities"]

)


# Save to database checkbox

save_to_db = st.sidebar.checkbox("Save summary to database", value=True)


# Process text when submitted

if st.button("Generate Summary"):

    # Get the text content

    text_content = ""

    if uploaded_file is not None:

        try:

            text_content = uploaded_file.getvalue().decode("utf-8")

        except UnicodeDecodeError:

            st.error("Unable to decode the file. Please ensure it's a valid text file.")

            return

    elif text_input:

        text_content = text_input

    else:

        st.warning("Please upload a file or paste text to summarize.")

        return

```

```
if text_content.strip():

    # Show progress

    progress_bar = st.progress(0)

    status_text = st.empty()


    # Phase 1: Text Processing

    status_text.text("Processing text...")

    progress_bar.progress(25)

    time.sleep(0.5) # Simulating processing time


    # Phase 2: Analysis

    status_text.text("Analyzing content...")

    progress_bar.progress(50)

    time.sleep(0.5) # Simulating processing time


    # Phase 3: Generating Summary

    status_text.text("Generating summary...")

    progress_bar.progress(75)


    try:

        # Generate summary using the TextSummarizer

        summary = summarizer.summarize(

            text_content,

            algorithm=algorithm,

            sentence_count=summary_length,

            percentage=summary_percentage,
```

```

        focus=focus
    )

    # Calculate metrics (compression ratio, etc.)
    metrics = summarizer.get_metrics(text_content, summary)
    compression_ratio = metrics["Compression Ratio (%)"]

    # Save to database if checkbox is selected
    if save_to_db:
        saved_summary = db.save_summary(
            original_text=text_content,
            summary_text=summary,
            algorithm=algorithm,
            sentence_count=summary_length,
            percentage=summary_percentage,
            focus=focus,
            compression_ratio=compression_ratio,
            title=summary_title
        )
        status_text.text(f"Summary generated and saved with ID: {saved_summary.id}")
    else:
        status_text.text("Summary generated!")

    # Complete the progress
    progress_bar.progress(100)

    time.sleep(0.5) # Give user time to see the completion

```

```
# Clear progress indicators

progress_bar.empty()

status_text.empty()


# Display results

col1, col2 = st.columns(2)


with col1:

    st.subheader("Original Text")

    st.text_area("", value=text_content, height=400, disabled=True)

    word_count = len(text_content.split())

    st.write(f"Word count: {word_count}")


with col2:

    st.subheader("Summary")

    st.text_area("", value=summary, height=400, disabled=True)

    summary_word_count = len(summary.split())

    st.write(f"Word count: {summary_word_count}")

    st.write(f"Compression ratio: {compression_ratio}%")


# Display key metrics

st.subheader("Summary Metrics")


# Display metrics in a dataframe for better visualization

metrics_df = pd.DataFrame([metrics])

st.dataframe(metrics_df)
```

```

except Exception as e:

    st.error(f"An error occurred during summarization: {str(e)}")

else:

    st.warning("The provided text is empty. Please provide some content to summarize.")


def view_history_page():

    st.title("Summary History")


    # Get all summaries from the database

    summaries = db.get_summaries()


    if not summaries:

        st.info("No summaries found in the database.")

        return


    # Create a dataframe for viewing the summaries

    summary_list = []

    for s in summaries:

        # Format the datetime

        created_at = s.created_at.strftime("%Y-%m-%d %H:%M")


        # Truncate the summary text for display

        short_summary = s.summary_text[:100] + "..." if len(s.summary_text) > 100 else
s.summary_text


        summary_list.append({

            "ID": s.id,

            "Title": s.title,

```



```

    "Algorithm": s.algorithm,
    "Created": created_at,
    "Compression": f"{s.compression_ratio:.2f}%",
    "Preview": short_summary,
    "Favorite": "✓" if s.is_favorite else ""
})

```

Display summaries as a dataframe

```
summary_df = pd.DataFrame(summary_list)
```

```
st.dataframe(summary_df, use_container_width=True)
```

View full summary

```
col1, col2 = st.columns(2)
```

with col1:

```

    selected_id = st.number_input("Enter Summary ID to view:", min_value=1,
                                   max_value=max([s.id for s in summaries]) if summaries else 1,
                                   step=1)

```

```
if st.button("View Full Summary"):
```

```
    selected_summary = db.get_summary(selected_id)
```

```
    if selected_summary:
```

```
        st.subheader(f"Summary: {selected_summary.title}")
```

Display metadata

```
meta_col1, meta_col2 = st.columns(2)
```

with meta_col1:

```

        st.write(f"***Algorithm:** {selected_summary.algorithm}")

        st.write(f"***Created:** {selected_summary.created_at.strftime('%Y-%m-%d %H:%M')}")

    with meta_col2:

        st.write(f"***Compression Ratio:** {selected_summary.compression_ratio:.2f}%")

        if selected_summary.focus:

            st.write(f"***Focus:** {selected_summary.focus}")

# Display text areas

text_col1, text_col2 = st.columns(2)

with text_col1:

    st.write("***Original Text:**")

    st.text_area("", value=selected_summary.original_text, height=400, disabled=True)

with text_col2:

    st.write("***Summary:**")

    st.text_area("", value=selected_summary.summary_text, height=400, disabled=True)

else:

    st.error("Summary not found.")

if __name__ == "__main__":

    main()

```

database.py

import os

import datetime

from sqlalchemy import create_engine, Column, Integer, String, Text, DateTime, Float, Boolean

from sqlalchemy.ext.declarative import declarative_base

from sqlalchemy.orm import sessionmaker

Get database URL from environment variable or default to SQLite if not set

DATABASE_URL = os.environ.get("DATABASE_URL", "sqlite:///./summaries.db")

Create SQLAlchemy engine and session

engine = create_engine(DATABASE_URL, connect_args={"check_same_thread": False} if "sqlite" in DATABASE_URL else {})

SessionLocal = sessionmaker(autocommit=False, autoflush=False, bind=engine)

Create base class for declarative models

Base = declarative_base()

Define Summary model

class Summary(Base):

 __tablename__ = "summaries"

 id = Column(Integer, primary_key=True, index=True)

 original_text = Column(Text)

 summary_text = Column(Text)

 algorithm = Column(String(50))

 sentence_count = Column(Integer, nullable=True)

 percentage = Column(Integer, nullable=True)

```
focus = Column(String(255), nullable=True)
```

```
compression_ratio = Column(Float)
```

```
created_at = Column(DateTime, default=datetime.datetime.utcnow)
```

```
# We'll add a title field that can be used to easily identify the summary
```

```
title = Column(String(255))
```

```
# We'll also add a favorite field
```

```
is_favorite = Column(Boolean, default=False)
```

```
# Create the tables in the database (only if they don't exist)
```

```
Base.metadata.create_all(bind=engine)
```

```
# Database operations
```

```
def get_db():
```

```
    """
```

```
    Get a database session.
```

```
    This function ensures that a session is created and managed properly for each transaction.
```

```
    """
```

```
    db = SessionLocal()
```

```
    try:
```

```
        yield db
```

```
    finally:
```

```
        db.close()
```

```
def save_summary(original_text, summary_text, algorithm, sentence_count=None,
```

```
percentage=None, focus=None, compression_ratio=0.0, title="Untitled Summary"):
```

```
"""
```

Save a summary to the database.

Args:

original_text (str): The original text

summary_text (str): The generated summary

algorithm (str): The algorithm used for summarization

sentence_count (int): Number of sentences in the summary

percentage (int): Percentage of original text to keep

focus (list): Features prioritized in the summary

compression_ratio (float): The compression ratio

title (str): A title for the summary

Returns:

Summary: The saved summary object

```
"""
```

```
db = next(get_db()) # Fetch the database session using the context manager
```

```
# Convert focus list to string if present
```

```
focus_str = None
```

```
if focus and isinstance(focus, list):
```

```
    focus_str = ", ".join(focus)
```

```
# Create new summary object
```

```
new_summary = Summary(
```

```
    original_text=original_text,
```

```
summary_text=summary_text,  
algorithm=algorithm,  
sentence_count=sentence_count,  
percentage=percentage,  
focus=focus_str,  
compression_ratio=compression_ratio,  
title=title  
)
```

```
# Add and commit to the database
```

```
db.add(new_summary)
```

```
db.commit()
```

```
db.refresh(new_summary)
```

```
return new_summary
```

```
def get_summaries(limit=10, skip=0):
```

```
    """
```

```
    Get all summaries from the database.
```

```
    Args:
```

```
        limit (int): Maximum number of summaries to return
```

```
        skip (int): Number of summaries to skip
```

```
    Returns:
```

```
        list: List of Summary objects
```

```
    """
```

```
    db = next(get_db()) # Fetch the database session using the context manager
```

```
return db.query(Summary).order_by(Summary.created_at.desc()).offset(skip).limit(limit).all()
```

```
def get_summary(summary_id):
```

```
    """
```

```
    Get a summary by ID.
```

```
    Args:
```

```
        summary_id (int): The ID of the summary
```

```
    Returns:
```

```
        Summary: The summary object or None if not found
```

```
    """
```

```
    db = next(get_db()) # Fetch the database session using the context manager
```

```
    return db.query(Summary).filter(Summary.id == summary_id).first()
```

```
def update_summary(summary_id, title=None, is_favorite=None):
```

```
    """
```

```
    Update a summary's title or favorite status.
```

```
    Args:
```

```
        summary_id (int): The ID of the summary
```

```
        title (str): The new title for the summary
```

```
        is_favorite (bool): Whether the summary is a favorite
```

```
    Returns:
```

```
        Summary: The updated summary object or None if not found
```

```
    """
```

```
db = next(get_db()) # Fetch the database session using the context manager
summary = db.query(Summary).filter(Summary.id == summary_id).first()
```

```
if not summary:
```

```
    return None
```

```
if title is not None:
```

```
    summary.title = title
```

```
if is_favorite is not None:
```

```
    summary.is_favorite = is_favorite
```

```
db.commit()
```

```
db.refresh(summary)
```

```
return summary
```

```
def delete_summary(summary_id):
```

```
    """
```

```
    Delete a summary by ID.
```

```
    Args:
```

```
        summary_id (int): The ID of the summary
```

```
    Returns:
```

```
        bool: True if summary was deleted, False otherwise
```

```
    """
```

```
db = next(get_db()) # Fetch the database session using the context manager
```



```
summary = db.query(Summary).filter(Summary.id == summary_id).first()
```

```
if not summary:
```

```
    return False
```

```
db.delete(summary)
```

```
db.commit()
```

```
return True
```

summarizer.py

```
import nltk
```

```
import numpy as np
```

```
import networkx as nx
```

```
from sklearn.feature_extraction.text import TfidfVectorizer, CountVectorizer
```

```
from sklearn.decomposition import TruncatedSVD
```

```
from text_processor import TextProcessor
```

```
# Download necessary NLTK resources
```

```
try:
```

```
    nltk.data.find('tokenizers/punkt')
```

```
    nltk.data.find('stopwords')
```

```
except LookupError:
```

```
    nltk.download('punkt')
```

```
    nltk.download('stopwords')
```

```
class TextSummarizer:
```

```
    def __init__(self):
```

```
        self.text_processor = TextProcessor()
```

```
    def summarize(self, text, algorithm="TextRank", sentence_count=None, percentage=None, focus=None):
```

```
        """
```

```
        Generate a summary of the given text using the specified algorithm.
```

```
        Args:
```

```
            text (str): The input text to summarize
```

```
            algorithm (str): The summarization algorithm to use
```

sentence_count (int): Number of sentences in the summary

percentage (int): Percentage of original text to keep

focus (list): Features to prioritize in the summary

Returns:

str: The summarized text

```
"""
```

```
# Validate input
```

```
if not text.strip():
```

```
    return ""
```

```
# Preprocess the text
```

```
sentences = self.text_processor.get_sentences(text)
```

```
# If there are no sentences after preprocessing, return empty string
```

```
if not sentences:
```

```
    return ""
```

```
# Determine the number of sentences to include in the summary
```

```
total_sentences = len(sentences)
```

```
if sentence_count:
```

```
    num_sentences = min(sentence_count, total_sentences)
```

```
elif percentage:
```

```
    num_sentences = max(1, int(total_sentences * percentage / 100))
```

```
else:
```

```
    # Default to 30% if neither is specified
```

```
    num_sentences = max(1, int(total_sentences * 0.3))
```

```

# Select the appropriate algorithm

if algorithm == "TextRank":

    summary_indices = self._textrank_summarize(sentences, num_sentences, focus)

elif algorithm == "Frequency-based":

    summary_indices = self._frequency_summarize(sentences, num_sentences, focus)

elif algorithm == "Latent Semantic Analysis":

    summary_indices = self._lsa_summarize(sentences, num_sentences, focus)

else:

    # Default to TextRank

    summary_indices = self._textrank_summarize(sentences, num_sentences, focus)


# Create summary by joining the selected sentences

summary = " ".join([sentences[i] for i in sorted(summary_indices)])


return summary

```

```

def _textrank_summarize(self, sentences, num_sentences, focus=None):

```

```

    """

```

Implement TextRank algorithm for extractive summarization.

Args:

sentences (list): List of preprocessed sentences

num_sentences (int): Number of sentences to include in summary

focus (list): Features to prioritize

Returns:

```

        list: Indices of sentences to include in the summary
    """

    # Create similarity matrix

    similarity_matrix = self._build_similarity_matrix(sentences)

    # Apply PageRank algorithm

    scores = nx.pagerank(nx.from_numpy_array(similarity_matrix))

    # Adjust scores based on focus if specified

    if focus:

        scores = self._adjust_scores_by_focus(sentences, scores, focus)

    # Sort sentences by score and return top indices

    ranked_indices = sorted(((scores[i], i) for i in range(len(sentences))), reverse=True)

    return [ranked_indices[i][1] for i in range(min(num_sentences, len(ranked_indices)))]

def _frequency_summarize(self, sentences, num_sentences, focus=None):
    """
    Implement frequency-based summarization.

    Args:

        sentences (list): List of preprocessed sentences

        num_sentences (int): Number of sentences to include in summary

        focus (list): Features to prioritize

    Returns:

        list: Indices of sentences to include in the summary

```

```

"""

# Create a TF-IDF matrix

vectorizer = TfidfVectorizer(stop_words='english')

tfidf_matrix = vectorizer.fit_transform([self.text_processor.preprocess_text(sentence) for
sentence in sentences])


# Calculate sentence scores based on the sum of TF-IDF values

sentence_scores = [sum(tfidf_matrix[i].toarray()[0]) for i in range(len(sentences))]


# Adjust scores based on focus if specified

if focus:

    sentence_scores = self._adjust_scores_by_focus(sentences, sentence_scores, focus)


# Sort sentences by score and return top indices

ranked_indices = sorted(((sentence_scores[i], i) for i in range(len(sentences))), reverse=True)

return [ranked_indices[i][1] for i in range(min(num_sentences, len(ranked_indices)))]

```

```

def _lsa_summarize(self, sentences, num_sentences, focus=None):

```

```

    """

```

Implement Latent Semantic Analysis for summarization.

Args:

sentences (list): List of preprocessed sentences

num_sentences (int): Number of sentences to include in summary

focus (list): Features to prioritize

Returns:

list: Indices of sentences to include in the summary

```

"""

# Create a document-term matrix

vectorizer = CountVectorizer(stop_words='english')

dtm = vectorizer.fit_transform([self.text_processor.preprocess_text(sentence) for sentence in
sentences])


# Apply SVD

lsa = TruncatedSVD(n_components=min(len(sentences), 10), random_state=42)

lsa.fit(dtm)


# Get sentence scores

terms_topics = lsa.components_

sentence_scores = []


for i, sentence in enumerate(sentences):

    sentence_vector = dtm[i].toarray()[0]

    score = 0

    for j, term_weight in enumerate(sentence_vector):

        if term_weight > 0:

            # Sum the term weights from the most important topics

            score += sum(abs(terms_topics[topic_idx, j]) for topic_idx in range(lsa.n_components))

    sentence_scores.append(score)


# Adjust scores based on focus if specified

if focus:

    sentence_scores = self._adjust_scores_by_focus(sentences, sentence_scores, focus)


# Sort sentences by score and return top indices

```

```
ranked_indices = sorted(((sentence_scores[i], i) for i in range(len(sentences))), reverse=True)
return [ranked_indices[i][1] for i in range(min(num_sentences, len(ranked_indices)))]
```

```
def _build_similarity_matrix(self, sentences):
```

```
    """
```

Build a similarity matrix for the sentences.

Args:

sentences (list): List of sentences

Returns:

numpy.ndarray: Similarity matrix

```
    """
```

```
# Number of sentences
```

```
n = len(sentences)
```

```
# Initialize similarity matrix
```

```
similarity_matrix = np.zeros((n, n))
```

```
# Process sentences to get vectors
```

```
vectorizer = TfidfVectorizer(stop_words='english')
```

```
vectors = vectorizer.fit_transform([self.text_processor.preprocess_text(sentence) for sentence
in sentences])
```

```
# Compute similarity between sentence pairs
```

```
for i in range(n):
```

```
    for j in range(n):
```

```
        if i != j:
```



```
similarity_matrix[i][j] = self._cosine_similarity(vectors[i], vectors[j])
```

```
return similarity_matrix
```

```
def _cosine_similarity(self, vec1, vec2):
```

```
    """
```

Calculate cosine similarity between two vectors.

Args:

vec1, vec2: Sparse vectors from TfidfVectorizer

Returns:

float: Cosine similarity value

```
    """
```

```
vec1_array = vec1.toarray()[0]
```

```
vec2_array = vec2.toarray()[0]
```

```
dot_product = np.dot(vec1_array, vec2_array)
```

```
norm_vec1 = np.linalg.norm(vec1_array)
```

```
norm_vec2 = np.linalg.norm(vec2_array)
```

```
if norm_vec1 == 0 or norm_vec2 == 0:
```

```
    return 0
```

```
return dot_product / (norm_vec1 * norm_vec2)
```

```
def _adjust_scores_by_focus(self, sentences, scores, focus):
```

"""

Adjust sentence scores based on focus parameters.

Args:

sentences (list): List of sentences

scores (list/dict): Current sentence scores

focus (list): Features to prioritize

Returns:

list: Adjusted sentence scores

"""

Convert dict to list if necessary

if isinstance(scores, dict):

score_list = [scores[i] for i in range(len(sentences))]

else:

score_list = scores.copy()

Apply adjustments based on focus

for i, sentence in enumerate(sentences):

Focus on key entities (proper nouns, important terms)

if "Key entities" in focus and self.text_processor.contains_key_entities(sentence):

score_list[i] *= 1.5

Focus on action sentences (usually contain verbs)

if "Action sentences" in focus and self.text_processor.is_action_sentence(sentence):

score_list[i] *= 1.3

```

        # Focus on quotations
        if "Quotations" in focus and self.text_processor.contains_quotation(sentence):
            score_list[i] *= 1.4

        # Focus on statistics (sentences with numbers)
        if "Statistics" in focus and self.text_processor.contains_statistics(sentence):
            score_list[i] *= 1.4

    return score_list

def get_metrics(self, original_text, summary):
    """
    Calculate metrics for the summary.

    Args:
        original_text (str): The original text
        summary (str): The generated summary

    Returns:
        dict: Dictionary of metrics
    """
    # Calculate basic metrics
    original_word_count = len(original_text.split())
    summary_word_count = len(summary.split())
    compression_ratio = round((1 - summary_word_count/original_word_count) * 100, 2)

    # Get sentence counts

```

```
original_sentence_count = len(self.text_processor.get_sentences(original_text))
```

```
summary_sentence_count = len(self.text_processor.get_sentences(summary))
```

```
return {
```

```
    "Original Word Count": original_word_count,
```

```
    "Summary Word Count": summary_word_count,
```

```
    "Compression Ratio (%)": compression_ratio,
```

```
    "Original Sentence Count": original_sentence_count,
```

```
    "Summary Sentence Count": summary_sentence_count
```

```
}
```

textprocessor.py

```
import re
```

```
import nltk
```

```
from nltk.tokenize import sent_tokenize, word_tokenize
```

```
from nltk.corpus import stopwords
```

```
# Download necessary NLTK resources
```

```
try:
```

```
    nltk.data.find('tokenizers/punkt')
```

```
    nltk.data.find('stopwords')
```

```
    nltk.data.find('taggers/averaged_perceptron_tagger')
```

```
except LookupError:
```

```
    nltk.download('punkt')
```

```
    nltk.download('stopwords')
```

```
    nltk.download('averaged_perceptron_tagger')
```

```
class TextProcessor:
```

```
    def __init__(self):
```

```
        self.stop_words = set(stopwords.words('english'))
```

```
    def get_sentences(self, text):
```

```
        """
```

```
        Split text into sentences.
```

```
        Args:
```

```
            text (str): Input text
```

Returns:

list: List of sentences

"""

Remove excessive whitespace

text = re.sub(r'\s+', ' ', text).strip()

Split into sentences

sentences = sent_tokenize(text)

Filter out very short sentences (likely not complete thoughts)

return [s.strip() for s in sentences if len(s.split()) > 3]

def preprocess_text(self, text):

"""

Preprocess text for analysis.

Args:

text (str): Input text

Returns:

str: Preprocessed text

"""

Convert to lowercase

text = text.lower()

Remove special characters and numbers

text = re.sub(r'[^w\s]', '', text)

```
text = re.sub(r'\d+', '', text)
```

```
# Tokenize
```

```
words = word_tokenize(text)
```

```
# Remove stopwords
```

```
filtered_words = [word for word in words if word not in self.stop_words]
```

```
# Join back to string
```

```
return ' '.join(filtered_words)
```

```
def contains_key_entities(self, sentence):
```

```
    """
```

Check if the sentence contains key entities (proper nouns or important terms).

Args:

 sentence (str): Input sentence

Returns:

 bool: True if sentence contains key entities

```
    """
```

```
# Tokenize and POS tag
```

```
tokens = word_tokenize(sentence)
```

```
pos_tags = nltk.pos_tag(tokens)
```

```
# Check for proper nouns (NNP, NNPS) or key terms
```

```
for word, tag in pos_tags:
```

```
if tag in ['NNP', 'NNPS']:
```

```
    return True
```

```
# Check for capitalized words that aren't at the beginning
```

```
for i, token in enumerate(tokens):
```

```
    if i > 0 and token[0].isupper():
```

```
        return True
```

```
return False
```

```
def is_action_sentence(self, sentence):
```

```
    """
```

```
    Check if the sentence describes an action (contains verbs).
```

```
    Args:
```

```
        sentence (str): Input sentence
```

```
    Returns:
```

```
        bool: True if sentence describes an action
```

```
    """
```

```
    # Tokenize and POS tag
```

```
    tokens = word_tokenize(sentence)
```

```
    pos_tags = nltk.pos_tag(tokens)
```

```
    # Check for verbs
```

```
    verb_tags = ['VB', 'VBD', 'VBG', 'VBN', 'VBP', 'VBZ']
```

```
    for _, tag in pos_tags:
```



```
if tag in verb_tags:
```

```
    return True
```

```
return False
```

```
def contains_quotation(self, sentence):
```

```
    """
```

```
    Check if the sentence contains a quotation.
```

```
    Args:
```

```
        sentence (str): Input sentence
```

```
    Returns:
```

```
        bool: True if sentence contains a quotation
```

```
    """
```

```
    # Check for quotation marks
```

```
    quotation_pattern = re.compile(r'["\'"].+?["\']')
```

```
    return bool(quotation_pattern.search(sentence))
```

```
def contains_statistics(self, sentence):
```

```
    """
```

```
    Check if the sentence contains statistics (numbers, percentages).
```

```
    Args:
```

```
        sentence (str): Input sentence
```

```
    Returns:
```

bool: True if sentence contains statistics

"""

Check for numbers and percentages

number_pattern = re.compile(r'\d+(\.\d+)?%?')

return bool(number_pattern.search(sentence))