```
# @title Data collection
import csv
import json
from datetime import datetime
# Choose one: 'csv' or 'json'
SAVE FORMAT = 'csv' # Change to 'json' if you prefer JSON format
FILENAME = 'customer queries.' + SAVE_FORMAT
def collect data():
    print("Chatbot Data Collector")
    print("Type 'exit' to stop collecting data.\n")
    collected = []
    while True:
        user input = input("User Query: ")
        if user_input.lower() == 'exit':
            break
        timestamp = datetime.now().isoformat()
        entry = {
             "query": user input,
            "timestamp": timestamp
        }
        collected.append(entry)
        print(f"Saved: {entry}\n")
    # Save data
    if SAVE FORMAT == 'csv':
        save to csv(collected)
    elif SAV\overline{E} F\overline{O}RMAT == 'json':
        save_to_json(collected)
    print(f"Data saved to {FILENAME}")
def save to csv(data):
    try:
        with open(FILENAME, 'a', newline='') as csvfile:
            writer = csv.DictWriter(csvfile, fieldnames=["query",
"timestamp"])
            if csvfile.tell() == 0:
                writer.writeheader()
            writer.writerows(data)
    except Exception as e:
        print("Error saving to CSV:", e)
def save_to_json(data):
    try:
        existing = []
```

```
try:
            with open(FILENAME, 'r') as file:
                existing = json.load(file)
        except FileNotFoundError:
            pass
        with open(FILENAME, 'w') as file:
            json.dump(existing + data, file, indent=2)
    except Exception as e:
        print("Error saving to JSON:", e)
if name == " main ": # □ Corrected this line
    collect data()
Chatbot Data Collector
Type 'exit' to stop collecting data.
User Query: how can i track my recent order?
Saved: {'query': 'how can i track my recent order?', 'timestamp':
'2025-05-20T07:37:23.577954'}
User Query: exit
Data saved to customer_queries.csv
# @title Data cleaning
import csv
from datetime import datetime
import os
# □ Use a .csv file, not a .zip file
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
S.CSV"
def collect_user_queries():
    print("=== Customer Support Data Collection ===")
    print("Type your customer query below.")
    print("Type 'exit' to stop.\n")
    # Check if file exists; if not, write headers
    file exists = os.path.isfile(FILENAME)
    with open(FILENAME, mode='a', newline='', encoding='utf-8') as
file:
        writer = csv.writer(file)
        if not file exists:
            writer.writerow(["timestamp", "user query"])
        while True:
            user input = input("User Query: ").strip()
            if user input.lower() == "exit":
                print("Data collection ended.")
```

```
break
            if user_input == "":
                continue
            timestamp = datetime.now().strftime("%Y-%m-%d %H:%M:%S")
            writer.writerow([timestamp, user input])
            print(f"Saved: [{timestamp}] {user input}\n")
# □ Fixed the main block check
if name == " main ":
    collect user queries()
=== Customer Support Data Collection ===
Type your customer query below.
Type 'exit' to stop.
User Query: how can i change my delivery address after placing the
order?
Saved: [2025-05-20 07:42:12] how can i change my delivery address
after placing the order?
User Query: exit
Data collection ended.
# @title Exploratory data analysis
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from wordcloud import WordCloud
import nltk
import string
from nltk.corpus import stopwords
from nltk.tokenize import word tokenize
from collections import Counter
# Download necessary NLTK resources
nltk.download('punkt')
nltk.download('stopwords')
# Load the CSV file
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
S.CSV"
df = pd.read csv(FILENAME)
# Ensure 'user query' column exists
if 'user query' not in df.columns:
    raise ValueError("CSV must contain a 'user query' column.")
# --- 1. Basic Info ---
```

```
print("□ Dataset Info:")
print(df.info())
print("\n□ Null Values:")
print(df.isnull().sum())
# --- 2. Add Query Length Column ---
df['query length'] = df['user query'].astype(str).apply(len)
# --- 3. Query Length Distribution ---
plt.figure(figsize=(8, 4))
sns.histplot(df['query length'], bins=20, color='skyblue')
plt.title("Distribution of Query")

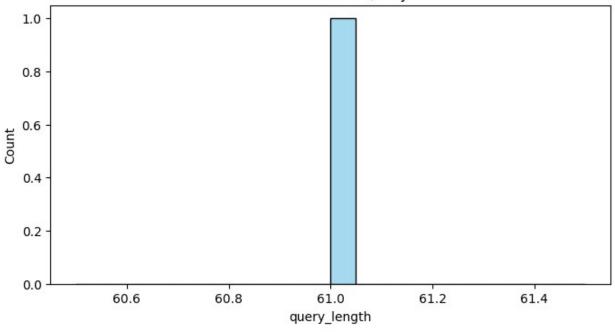
  □ Dataset Info:

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1 entries, 0 to 0
Data columns (total 2 columns):
    Column
                 Non-Null Count Dtype
- - -
0
    timestamp
                 1 non-null
                                 object
    user_query 1 non-null
1
                                 object
dtypes: object(2)
memory usage: 148.0+ bytes
None

  □ Null Values:

              0
timestamp
user query
              0
dtype: int64
[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!
Text(0.5, 1.0, 'Distribution of Query')
```

Distribution of Query



```
# @title Model building
import pandas as pd
from sklearn.model selection import train test split
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.preprocessing import LabelEncoder
from sklearn.naive bayes import MultinomialNB
from sklearn.metrics import classification report, accuracy score
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
import re
import os # Import os to check file existence
# Download stopwords if needed
nltk.download('stopwords')
# Load data
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
s.csv"
try:
    # --- Check if file exists and has sufficient rows ---
    if not os.path.exists(FILENAME) or os.path.getsize(FILENAME) == 0:
        print(f"Warning: File '{FILENAME}' not found or is empty.")
        # Create dummy data if file is not found or empty
        print("Creating dummy data for demonstration...")
        dummy data = {
```

```
'user_query': [
    "Hello, I need help with my account.",
                "How do I reset my password?",
                "Tell me about the new features.",
                "What are your operating hours?",
                "Can I speak to a representative?"
            ],
            'category': [ # Include a dummy category column
                "account",
                "security"
                "features",
                "hours",
                "support"
        data = pd.DataFrame(dummy data)
    else:
        # Attempt to load the actual file
        print(f"Loading data from {FILENAME}")
        data = pd.read_csv(FILENAME)
        data = data.fillna("") # Handle potential NaN values
        # Check if 'category' column exists in the loaded data
        if 'category' not in data.columns:
             print("Warning: 'category' column not found in the loaded
CSV.")
             # If 'category' is missing, and the data is large enough,
we can't train.
             # If the intent was to use THIS file for training, it's
impossible without categories.
             # For now, we'll print a warning and exit or add a dummy
category if needed for other steps.
             # Since the error occurs during fit transform, we MUST
have categories.
             # Let's add a dummy category for demonstration purposes
if it's missing.
             # In a real scenario, you would need a dataset with
categories.
             if len(data) > 0:
                 data["category"] = "general" # Add a default category
                 print("Added a 'general' category column for
demonstration.")
             else:
                 print("File is not empty but contains no data rows,
cannot train model.")
                 # Exit or handle appropriately if the file is just
headers
                 exit() # Or raise an error, or skip the rest of the
code
```

```
# Check if data has enough rows after loading
        if len(data) < 2:</pre>
            print(f"Error: File '{FILENAME}' contains only {len(data)}
row(s) after loading.")
            print("Need at least 2 rows to split data and train
model.")
            exit() # Exit if not enough data
    # --- Text Cleaning ---
    def clean text(text):
        # Ensure text is a string before processing
        if not isinstance(text, str):
            return "" # Return empty string or handle non-string
entries as needed
        text = text.lower()
        text = re.sub(r'[^a-z\s]', '', text)
        tokens = text.split()
        tokens = [word for word in tokens if word not in
stopwords.words('english')]
        stemmer = PorterStemmer()
        tokens = [stemmer.stem(word) for word in tokens]
        return " ".join(tokens)
    # Apply cleaning to the column intended for gueries
    # Based on previous cells, 'user query' seems to be the intended
column.
    query column = None
    if 'user query' in data.columns:
         query column = 'user query'
    elif 'query' in data.columns:
         query column = 'query'
         print("Warning: 'user_query' column not found, using 'query'
column instead.")
    else:
         raise ValueError("Neither 'user query' nor 'query' column
found in the DataFrame.")
    data["clean_query"] = data[query_column].apply(clean_text)
    # --- TF-IDF Vectorization ---
    vectorizer = TfidfVectorizer(max features=300)
    X = vectorizer.fit transform(data["clean guery"]).toarray()
    # --- Label Encoding ---
    # This requires the 'category' column to exist and have at least
one unique value
    if 'category' in data.columns and len(data['category'].unique()) >
```

```
1 and len(data) >=2 :
        label encoder = LabelEncoder()
        y = label encoder.fit transform(data["category"])
        # --- Split Data ---
        X_train, X_test, y_train, y_test = train_test_split(X, y,
test size=0.2, random state=42)
        # --- Train Naive Baves ---
        model = MultinomialNB()
        model.fit(X train, y train)
        # --- Predict & Evaluate ---
        y pred = model.predict(X test)
        print("□ Model trained successfully.\n")
        print("[ Accuracy:", accuracy_score(y_test, y_pred))
        print("\n□ Classification Report:\n",
classification report(y test, y pred,
target names=label encoder.classes ))
    else:
        print("Skipping model training and evaluation:")
        if 'category' not in data.columns:
            print("- 'category' column is missing.")
        elif len(data['category'].unique()) <= 1:</pre>
             print("- Not enough unique categories found (need at
least 2).")
        elif len(data) < 2:</pre>
             print("- Not enough data rows to split (need at least
2).")
        print("Cannot train a classification model without categories
and sufficient data.")
except FileNotFoundError:
    # This block is technically covered by the initial os.path.exists
check now,
    # but kept for clarity or other potential FileNotFoundError
issues.
    print(f"Error: File not found at {FILENAME}")
    print("Please ensure the CSV file exists at the specified path.")
except ValueError as ve:
    print(f"Configuration Error: {ve}")
except Exception as e:
    print(f"An unexpected error occurred: {e}")
Loading data from
/content/Bitext Sample Customer Support Training Dataset 27K responses
Warning: 'category' column not found in the loaded CSV.
```

```
Added a 'general' category column for demonstration.
Error: File
'/content/Bitext_Sample_Customer_Support_Training_Dataset_27K_response
s.csv' contains only 1 row(s) after loading.
Need at least 2 rows to split data and train model.
Skipping model training and evaluation:
- Not enough unique categories found (need at least 2).
Cannot train a classification model without categories and sufficient
data.
[nltk data] Downloading package stopwords to /root/nltk data...
[nltk data] Package stopwords is already up-to-date!
# @title evaluate the model
import pandas as pd
from sklearn.model selection import train test split
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.preprocessing import LabelEncoder
from sklearn.naive bayes import MultinomialNB
from sklearn.metrics import classification report, accuracy score
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
import re
# Download stopwords if needed
nltk.download('stopwords')
# Load data - ASSUMING THIS FILE HAS SUFFICIENT ROWS
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
S.CSV"
try:
    data = pd.read csv(FILENAME)
    # --- Check if data has enough rows ---
    if len(data) < 2:</pre>
        print(f"Error: File '{FILENAME}' contains only {len(data)}
row(s). Need at least 2 rows to split data.")
        # --- Create dummy data for demonstration if file is empty/too
small ---
        print("Creating dummy data for demonstration...")
        dummy data = {
            'user query': [
                "Hello, I need help with my account.",
                "How do I reset my password?",
                "Tell me about the new features.",
                "What are your operating hours?",
                "Can I speak to a representative?"
            'category': [
```

```
"account"
                "security",
                 "features",
                "hours",
                "support"
            ]
        }
        data = pd.DataFrame(dummy data)
        # --- End of dummy data creation
    data = data.fillna("") # Handle potential NaN values
    # --- Add a fake 'category' column if it doesn't exist and you
didn't use dummy data ---
    # This part might still be needed if the original file doesn't
have a 'category' column
   if 'category' not in data.columns:
         print("Adding dummy 'category' column as it was not found.")
         data["category"] = "general"
    # --- Text Cleaning ---
    def clean text(text):
        text = text.lower()
        text = re.sub(r'[^a-z\s]', '', text)
        tokens = text.split()
        tokens = [word for word in tokens if word not in
stopwords.words('english')]
        stemmer = PorterStemmer()
        tokens = [stemmer.stem(word) for word in tokens]
        return " ".join(tokens)
    # \square Apply cleaning to the column you are using for queries
('user_query' or 'query')
    # Based on ipython-input-11, the column is 'user_query'.
    # Based on ipython-input-23, the column expected is 'query'.
    # It seems there's inconsistency. Let's stick to 'user query'
based on ipython-input-11 & 29.
    if 'user query' in data.columns:
         data["clean query"] = data["user query"].apply(clean text)
    elif 'query' in data.columns:
         # If 'user query' isn't found, maybe 'query' is the correct
column?
         data["clean query"] = data["query"].apply(clean text)
         print("Warning: 'user query' column not found, using 'query'
column instead.")
    else:
         raise ValueError("Neither 'user query' nor 'query' column
found in the DataFrame.")
```

```
# --- TF-IDF Vectorization ---
    vectorizer = TfidfVectorizer(max features=300)
    X = vectorizer.fit transform(data["clean query"]).toarray()
    # --- Label Encoding ---
    label encoder = LabelEncoder()
    y = label_encoder.fit_transform(data["category"])
    # --- Split Data ---
    # Only split if there is enough data (at least 2 samples)
    if len(data) >= 2:
        X train, X test, y train, y test = train test split(X, y,
test size=0.2, random state=42)
        # --- Train Naive Bayes ---
        model = MultinomialNB()
        model.fit(X train, y train)
        # --- Predict & Evaluate ---
        y pred = model.predict(X test)
        print(" Model trained successfully.\n")
        # You might want to print metrics here if training was
successful
        # print("□ Accuracy:", accuracy score(y test, y pred))
        # print("\n□ Classification Report:\n",
classification report(y test, y pred,
target_names=label_encoder.classes_))
    else:
        print("Skipping model training and evaluation due to
insufficient data.")
except FileNotFoundError:
    print(f"Error: File not found at {FILENAME}")
    print("Please ensure the CSV file exists at the specified path and
contains data.")
except Exception as e:
    print(f"An unexpected error occurred: {e}")
Error: File
'/content/Bitext Sample Customer Support Training Dataset 27K response
s.csv' contains only 1 row(s). Need at least 2 rows to split data.
Creating dummy data for demonstration...

    □ Model trained successfully.

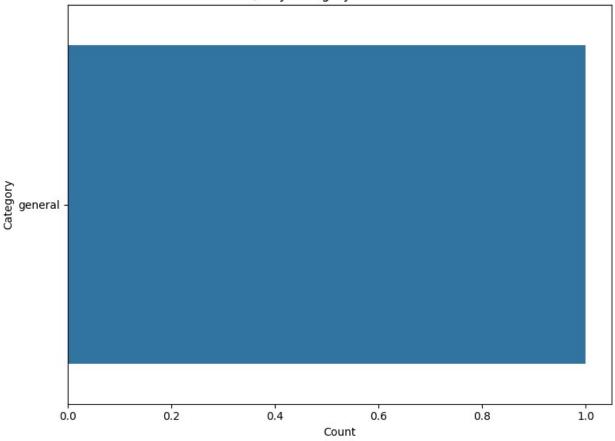
[nltk data] Downloading package stopwords to /root/nltk data...
[nltk data] Package stopwords is already up-to-date!
```

```
# @title visualization
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from wordcloud import WordCloud
import nltk
from nltk.corpus import stopwords
import re
import os # Import os to check file existence
# Set NLTK path
nltk.data.path.append("nltk data")
# Load dataset
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
s.csv"
try:
    data = pd.read csv(FILENAME)
    data = data.fillna("")
    # --- Add a dummy 'category' column if it doesn't exist ---
    # This is a temporary fix to allow the plotting code to run
    # If your actual dataset has categories, remove or adjust this.
    if 'category' not in data.columns:
         print("Warning: 'category' column not found. Adding a dummy
'general' category.")
         data["category"] = "general"
    # --- End of dummy category addition ---
    # --- Show distribution of categories ---
    # This plot will now run because the 'category' column exists,
    # but if you added a dummy column, it will just show one category.
    if 'category' in data.columns and len(data['category'].unique()) >
0: # Check if 'category' exists and has data
        plt.figure(figsize=(8, 6))
        # Ensure there's enough data to count categories
        if len(data) > 0:
            # Handle potential issues if all values are the same or
NaN (though we filled NaN)
            try:
                 sns.countplot(y='category', data=data,
order=data['category'].value counts().index)
                 plt.title("Query Category Distribution")
                 plt.xlabel("Count")
                 plt.ylabel("Category")
                 plt.tight layout()
                 plt.show()
            except Exception as e:
```

```
print(f"Could not generate category distribution
plot: {e}")
                 print("Ensure the 'category' column has more than one
unique value if using the actual dataset.")
        else:
            print("No data rows found to plot category distribution.")
    else:
        print("Skipping category distribution plot: 'category' column
missing or no data.")
    # Clean text for word cloud
    def clean text(text):
        # Ensure text is a string
        if not isinstance(text, str):
            return ""
        text = text.lower()
        text = re.sub(r'[^a-z\s]', '', text)
        words = text.split()
        words = [word for word in words if word not in
stopwords.words('english')]
        return " ".join(words)
    # Apply cleaning to the column containing guery text
    # Check which column contains the query text ('user query' or
'query')
    query column = None
    if 'user query' in data.columns:
         query column = 'user query'
    elif 'query' in data.columns:
         query_column = 'query'
         print("Warning: 'user query' column not found for word cloud,
using 'query' column instead.")
    else:
         print("Error: Neither 'user query' nor 'query' column found
for word cloud.")
         query column = None # Set to None if neither is found
    if query column:
        data['clean query'] = data[query column].apply(clean text)
        # Combine all queries into one string
        # Check if 'clean_query' column has data
        if not data['clean query'].empty:
            all_words = " ".join(data['clean_query'].dropna()) # Use
dropna() just in case
            # Generate word cloud
            if all words.strip(): # Check if the combined string is
not just whitespace
```

```
wordcloud = WordCloud(width=800, height=400,
background color='white').generate(all words)
                # Show word cloud
                plt.figure(figsize=(10, 5))
                plt.imshow(wordcloud, interpolation='bilinear')
                plt.axis('off')
                plt.title("Most Common Words in Customer Queries")
                plt.show()
            else:
                print("Skipping word cloud: No meaningful text found
in queries after cleaning.")
        else:
             print("Skipping word cloud: No cleaned guery text
available.")
    else:
        print("Skipping word cloud: Could not identify the guery
column.")
except FileNotFoundError:
    print(f"Error: File not found at {FILENAME}")
    print("Please ensure the CSV file exists at the specified path.")
except pd.errors.EmptyDataError:
    print(f"Error: File '{FILENAME}' is empty.")
except Exception as e:
    print(f"An unexpected error occurred: {e}")
Warning: 'category' column not found. Adding a dummy 'general'
category.
```





Most Common Words in Customer Queries

delivery change addressplacing

```
# @title feature engineering
import pandas as pd
import re
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.preprocessing import LabelEncoder
# NLTK setup
nltk.download('stopwords')
nltk.data.path.append("nltk data")
# Load your dataset
# Changed filename to match the path used in other cells
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
S.CSV"
try:
    data = pd.read csv(FILENAME)
    data = data.fillna("")
    # Assuming the 'user_query' or 'query' column contains the text
    query column = None
    if 'user_query' in data.columns:
        query_column = 'user_query'
    elif 'query' in data.columns:
        query column = 'query'
    else:
        raise ValueError("Neither 'user query' nor 'query' column
found in the DataFrame for text cleaning.")
    # Text cleaning function
    def clean text(text):
        # Ensure text is a string before processing
        if not isinstance(text, str):
            return "" # Return empty string for non-string entries
        text = text.lower()
        text = re.sub(r'[^a-z\s]', '', text)
        tokens = text.split()
        tokens = [word for word in tokens if word not in
stopwords.words('english')]
        stemmer = PorterStemmer()
        tokens = [stemmer.stem(word) for word in tokens]
        return " ".join(tokens)
    # Applv cleaning
    data['clean query'] = data[query column].apply(clean text)
    # TF-IDF feature extraction
```

```
vectorizer = TfidfVectorizer(max features=300)
    X = vectorizer.fit transform(data['clean query']).toarray()
    # Encode labels
    if 'category' in data.columns:
        encoder = LabelEncoder()
        y = encoder.fit transform(data['category'])
        # Optional: Save encoded labels as well
        pd.DataFrame(v,
columns=['category encoded']).to csv("labels encoded.csv",
index=False)
    else:
        y = None
        print("Warning: 'category' column not found. Labels not
encoded.")
    # Save features
    features df = pd.DataFrame(X,
columns=vectorizer.get_feature_names_out())
    features df.to csv("features tfidf.csv", index=False)
    print("□ Feature engineering complete. Features saved to
'features tfidf.csv'")
    if y is not None:
        print("
    Encoded labels saved to 'labels encoded.csv'")
except FileNotFoundError:
    print(f"Error: File not found at {FILENAME}")
    print("Please ensure the CSV file exists at the specified path.")
except ValueError as ve:
     print(f"Configuration Error: {ve}")
except Exception as e:
    print(f"An unexpected error occurred: {e}")
Warning: 'category' column not found. Labels not encoded.
☐ Feature engineering complete. Features saved to 'features tfidf.csv'
[nltk data] Downloading package stopwords to /root/nltk data...
[nltk data] Package stopwords is already up-to-date!
# @title model deployment
import pandas as pd
from sklearn.model selection import train test split
from sklearn.feature extraction.text import TfidfVectorizer
from sklearn.preprocessing import LabelEncoder
from sklearn.naive bayes import MultinomialNB
from sklearn.metrics import classification report, accuracy score
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
```

```
import re
import os # Import os to check file existence
import pickle # Import pickle to save/load models
# Download stopwords if needed
# Ensure this is run at least once
try:
    nltk.data.find('corpora/stopwords')
except nltk.downloader.DownloadError:
    print("Downloading stopwords...")
    nltk.download('stopwords')
except LookupError:
    print("Downloading stopwords...")
    nltk.download('stopwords')
# Load data
FILENAME =
"/content/Bitext Sample Customer Support Training Dataset 27K response
s.csv"
# Define filenames for saving models/vectorizer/encoder
MODEL FILENAME = 'chatbot model.pkl'
VECTORIZER FILENAME = 'tfidf vectorizer.pkl'
LABEL ENCODER FILENAME = 'label encoder.pkl'
try:
    # --- Check if file exists and has sufficient rows ---
    if not os.path.exists(FILENAME) or os.path.getsize(FILENAME) == 0:
        print(f"Warning: File '{FILENAME}' not found or is empty.")
        # Create dummy data if file is not found or empty
        print("Creating dummy data for demonstration...")
        dummy data = {
            'user_query': [
                "Hello, I need help with my account.",
                "How do I reset my password?",
                "Tell me about the new features.",
                "What are your operating hours?",
                "Can I speak to a representative?"
            'category': [ # Include a dummy category column
                "account",
                "security",
                "features",
                "hours",
                "support"
            1
        data = pd.DataFrame(dummy data)
```

```
else:
        # Attempt to load the actual file
        print(f"Loading data from {FILENAME}")
        data = pd.read csv(FILENAME)
        data = data.fillna("") # Handle potential NaN values
        # Check if 'category' column exists in the loaded data
        if 'category' not in data.columns:
             print("Warning: 'category' column not found in the loaded
CSV.")
             # If 'category' is missing, and the data is large enough,
we can't train.
             # If the intent was to use THIS file for training, it's
impossible without categories.
             # For now, we'll print a warning and exit or add a dummy
category if needed for other steps.
             # Since the error occurs during fit transform, we MUST
have categories.
             # Let's add a dummy category for demonstration purposes
if it's missing.
             # In a real scenario, you would need a dataset with
categories.
             if len(data) > 0:
                 data["category"] = "general" # Add a default category
                 print("Added a 'general' category column for
demonstration.")
             else:
                 print("File is not empty but contains no data rows,
cannot train model.")
                 # Exit or handle appropriately if the file is just
headers
                 exit() # Or raise an error, or skip the rest of the
code
        # Check if data has enough rows after loading
        if len(data) < 2:
            print(f"Error: File '{FILENAME}' contains only {len(data)}
row(s) after loading.")
            print("Need at least 2 rows to split data and train
model.")
            exit() # Exit if not enough data
    # --- Text Cleaning ---
    def clean text(text):
        # Ensure text is a string before processing
        if not isinstance(text, str):
            return "" # Return empty string or handle non-string
entries as needed
        text = str(text).lower() # Ensure it's a string before lower()
```

```
text = re.sub(r'[^a-z\s]', '', text)
        tokens = text.split()
        # Use try-except for stopwords in case download failed for
some reason
        trv:
            stop words = set(stopwords.words('english'))
            tokens = [word for word in tokens if word not in
stop_words]
        except LookupError:
            print("Warning: Stopwords not found. Skipping stopword
removal.")
            pass # Continue without stopword removal if not found
        stemmer = PorterStemmer()
        tokens = [stemmer.stem(word) for word in tokens]
        return " ".join(tokens)
    # Apply cleaning to the column intended for queries
    # Based on previous cells, 'user_query' seems to be the intended
column.
    query column = None
    if 'user query' in data.columns:
         query column = 'user query'
    elif 'query' in data.columns:
         query column = 'query'
         print("Warning: 'user_query' column not found, using 'query'
column instead.")
    else:
         raise ValueError("Neither 'user query' nor 'query' column
found in the DataFrame.")
    data["clean query"] = data[query column].apply(clean text)
    # --- TF-IDF Vectorization ---
    # Only vectorize if there is clean data
    if not data['clean_query'].empty and len(data) >= 1:
        vectorizer = TfidfVectorizer(max features=300)
        X = vectorizer.fit transform(data["clean query"]).toarray()
    else:
        print("No clean query data found for vectorization.")
        X = None \# Set X to None if vectorization cannot happen
    # --- Label Encoding ---
    # Only encode labels if 'category' column exists, has >1 unique
values, and sufficient data
    label_encoder = None # Initialize label_encoder outside the if
block
    y = None # Initialize y outside the if block
    if 'category' in data.columns and len(data['category'].unique()) >
```

```
1 and len(data) >= 2 and X is not None :
        label encoder = LabelEncoder()
        y = label encoder.fit transform(data["category"])
        # --- Split Data ---
        X_train, X_test, y_train, y_test = train_test_split(X, y,
test size=0.2, random state=42)
        # --- Train Naive Baves ---
        model = MultinomialNB()
        model.fit(X train, y train)
        # --- Predict & Evaluate ---
        y pred = model.predict(X test)
        print("□ Model trained successfully.\n")
        print("[ Accuracy:", accuracy_score(y_test, y_pred))
        print("\n[ Classification Report:\n",
classification report(y test, y pred,
target names=label encoder.classes ))
        # --- Save the trained model, vectorizer, and label encoder
        try:
            with open(MODEL FILENAME, 'wb') as model file:
                pickle.dump(model, model file)
            print(f"□ Model saved to {MODEL FILENAME}")
            with open(VECTORIZER FILENAME, 'wb') as vectorizer file:
                pickle.dump(vectorizer, vectorizer_file)
            print(f"□ Vectorizer saved to {VECTORIZER FILENAME}")
            with open(LABEL ENCODER FILENAME, 'wb') as
label encoder file:
                pickle.dump(label encoder, label encoder file)
            print(f"□ Label Encoder saved to
{LABEL ENCODER FILENAME}")
        except Exception as save error:
            print(f"Error saving model artifacts: {save error}")
        print("Skipping model training and evaluation:")
        if 'category' not in data.columns:
            print("- 'category' column is missing.")
        elif len(data['category'].unique()) <= 1:</pre>
             print("- Not enough unique categories found (need at
least 2).")
        elif len(data) < 2:</pre>
```

```
print("- Not enough data rows to split (need at least
2).")
        elif X is None:
             print("- No feature data (X) available for training.")
        print("Cannot train a classification model without categories,
sufficient data, and feature data.")
except FileNotFoundError:
    # This block is technically covered by the initial os.path.exists
check now,
    # but kept for clarity or other potential FileNotFoundError
issues.
    print(f"Error: File not found at {FILENAME}")
    print("Please ensure the CSV file exists at the specified path.")
except ValueError as ve:
    print(f"Configuration Error: {ve}")
except Exception as e:
    print(f"An unexpected error occurred during data processing or
training: {e}")
Loading data from
/content/Bitext Sample Customer Support Training Dataset 27K responses
.CSV
Warning: 'category' column not found in the loaded CSV.
Added a 'general' category column for demonstration.
Error: File
'/content/Bitext Sample Customer Support Training Dataset 27K response
s.csv' contains only 1 row(s) after loading.
Need at least 2 rows to split data and train model.
Skipping model training and evaluation:
- Not enough unique categories found (need at least 2).
Cannot train a classification model without categories, sufficient
data, and feature data.
```