```
import numpy as np
import pandas as pd
from google.colab import files
uploaded = files.upload()
₹
      Choose Files spam texts.csv
        spam_texts.csv(text/csv) - 503663 bytes, last modified: 3/22/2025 - 100% done
#here we read the uploaded file using a specific encoding known as ISO-8859-1 (also known as latin1)
df = pd.read_csv('spam_texts.csv', encoding='ISO-8859-1')
df.sample(20)
₹
                v1
                                                                v2 Unnamed: 2 Unnamed: 3 Unnamed: 4
                                                                                                              Ħ
                   Hope youå Õre not having too much fun without m...
      4068
              ham
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      3479
                                                                                                      NaN
              ham
                                           What was she looking for?
                                                                            NaN
                                                                                         NaN
      2478
              ham
                           Not yet. Just i'd like to keep in touch and it...
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      4511
              ham
                             Now project pa. After that only i can come.
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      2850
              ham
                               Are you going to wipro interview today?
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
                                                                                                      NaN
      2823
              ham
                        No need to buy lunch for me.. I eat maggi mee..
                                                                            NaN
                                                                                         NaN
      5006
                                         Oh k. . I will come tomorrow
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
              ham
                       O. Well uv causes mutations. Sunscreen is like...
                                                                                         NaN
                                                                                                      NaN
       555
              ham
                                                                            NaN
       927
              ham
                                      K:)i will give my kvb acc details:)
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      2051
              ham
                           Hey darlin.. i can pick u up at college if u t...
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
       258
             spam
                         We tried to contact you re your reply to our o...
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
                         Yunny i'm walking in citylink now Ì_ faster co...
                                                                                         NaN
                                                                                                      NaN
      2510
              ham
                                                                            NaN
                                  Just haven't decided where yet eh?
                                                                                         NaN
      3111
              ham
                                                                            NaN
                                                                                                      NaN
                                          Ok lor thanx... ÌÏ in school?
                                                                                         NaN
      1802
              ham
                                                                            NaN
                                                                                                      NaN
      1156
              ham
                      Hey.. Something came up last min.. Think i wun...
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
                       Double your mins & txts on Orange or 1/2 price...
                                                                                         NaN
                                                                                                      NaN
      2342
             spam
                                                                            NaN
      3448
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
              ham
                                                     Sorry. || mail? ||
      1483
              ham
                        Purity of friendship between two is not about ...
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      4712
                       Big brother □Û÷s really scraped the barrel with...
              ham
                                                                            NaN
                                                                                         NaN
                                                                                                      NaN
      2439
              ham
                           Rightio 11 48 it is then. Well arent we all II
                                                                            NaN
                                                                                         NaN
                                                                                                       NaN
df.shape
     (5572, 5)
# Drop unnecessary columns
df = df[['v1', 'v2']]
# Rename columns for clarity
df.columns = ['label', 'message']
```

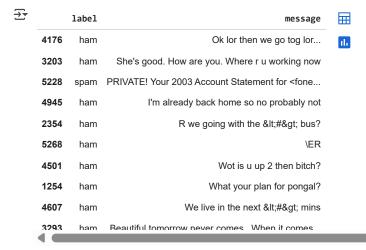
Data Cleaning and Processing

```
df.info(), df['label'].value_counts()
```

<<class 'pandas.core.frame.DataFrame'>
RangeIndex: 5572 entries, 0 to 5571
Data columns (total 2 columns):

```
Column
             Non-Null Count Dtype
             5572 non-null
    label
                             object
    message 5572 non-null
                            object
1
dtypes: object(2)
memory usage: 87.2+ KB
(None,
label
ham
        4825
         747
spam
Name: count, dtype: int64)
```

df.sample(10)



Data Preprocessing

```
import re
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
from nltk.tokenize import word_tokenize # Changed 'word_tokeniz' to 'word_tokenize'
# Download necessary NLTK datasets
nltk.download('punkt')
nltk.download('stopwords')
→ [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!
     True
# Initialize stemmer and stop words
stemmer = PorterStemmer()
stop_words = set(stopwords.words('english'))
# Convert labels to binary values: ham = 0, spam = 1
df['label'] = df['label'].map({'ham': 0, 'spam': 1})
# Function to process text without using NLTK's word tokenize
def process_text_manually(text):
   # Lowercase the text
   text = text.lower()
   # Tokenization: Split text into words (using split())
   tokens = text.split()
   # Remove punctuation and special characters, keep only alphabetic tokens
   tokens = [word for word in tokens if word.isalpha()]
   # Remove stopwords
   # Changed 'basic_stopwords' to 'stop_words'
   tokens = [word for word in tokens if word not in stop_words]
```

```
Spam_Texts.ipynb - Colab
    # Apply stemming
    tokens = [stemmer.stem(word) for word in tokens]
    # Join the tokens back into a single string
    return ' '.join(tokens)
# Apply the new processing function to the 'message' column
df['cleaned_message'] = df['message'].apply(process_text_manually)
# Display cleaned messages and labels
df[['message', 'cleaned_message']].head()
₹
                                                                                                           \blacksquare
                                                message
                                                                                     cleaned_message
             Go until jurong point, crazy.. Available only ... \, go jurong avail bugi n great world la e cine g...
       0
                                Ok lar... Joking wif u oni...
                                                                                           ok joke wif u
          Free entry in 2 a wkly comp to win FA Cup fina...
                                                           free entri wkli comp win fa cup final tkt may ...
           U dun say so early hor... U c already then say...
                                                                              u dun say earli u c alreadi
             Nah I don't think he does to jist he lives aro
                                                                        nah think doe live around though
df.sample(20)
₹
              lahe1
                                                                                                         cleaned_message
                                                                        message
       1547
                  0
                                  Bishan lar nearer... No need buy so early cos ... bishan lar need buy earli co buy gotta park
                                                                                                     also bring galileo dobbi
       817
                  0
                                            Also are you bringing galileo or dobby
       2654
                   0
                                                      Its sarcasm.. .nt scarcasim
                                                                                                                 scarcasim
       4451
                  0
                                     I've told you everything will stop. Just dont ...
                                                                                                     told everyth dont let get
       4938
                                   Tomarrow i want to got to court. At &It;DECIM...
                                                                                          tomarrow want got come bu stand
                   0
       3002
                  0
                                                         I will see in half an hour
                                                                                                               see half hour
                                  I just saw ron burgundy captaining a party boa...
       3509
                   0
                                                                                    saw ron burgundi captain parti boat yeah
       650
                  0
                               Thats cool! Sometimes slow and gentle. Sonetim...
                                                                                       that sometim slow sonetim rough hard
       3484
                   0
                                  No:-)i got rumour that you going to buy apartm...
                                                                                                    got rumour go buy apart
       149
                  0
                                                      Sindu got job in birla soft ..
                                                                                                      sindu got job birla soft
       2483
                   0
                                 Mm have some kanji dont eat anything heavy ok
                                                                                           mm kanji dont eat anyth heavi ok
       3626
                   0
                                    Still chance there. If you search hard you wil...
                                                                                                still chanc search hard get tri
       2849
                   0
                                 She's fine. Good to hear from you. How are you...
                                                                                                  good hear happi new year
                      JADE ITS PAUL. Y DIDNÅÕT U TXT ME? DO U REMEMB...
       4977
                                                                                    jade didnåõt u txt u rememb want talk txt
                  0
                                    Carlos is down but I have to pick it up from h...
                                                                                                  carlo pick swing usf littl bit
       4595
       3091
                  0
                                  Dear, take care. I am just reaching home.love ...
                                                                                                               take reach u
       3273
                  0
                                                                    Thanx a lot...
                                                                                                                      thanx
                                                        Then mum's repent how?
       661
                  0
                                                                                                                     repent
       203
                  0
                                                       Goodmorning sleeping ga.
                                                                                                            goodmorn sleep
       5440
                  n
                                    Thank you do you generally date the brothas?
                                                                                                           thank gener date
# missing values
df.isnull().sum()
→
             label
                            0
           message
                            0
       cleaned_message
```

```
# checking for duplicate values
df.duplicated().sum()
→ np.int64(403)
# remove duplicates
df = df.drop_duplicates(keep='first')
df.duplicated().sum()
→ np.int64(0)
df.shape
→ (5169, 3)
Text Vectorization
from sklearn.model_selection import train_test_split
# Split into train and test sets
X_train, X_test, y_train, y_test = train_test_split(
    df['cleaned_message'], df['label'], test_size=0.2, random_state=42)
# Show number of samples in each set
len(X_train), len(X_test)
→ (4135, 1034)
# Display first 3 samples from training and test sets
train_samples = pd.DataFrame({'message': X_train[:3].values, 'label': y_train[:3].values})
test_samples = pd.DataFrame({'message': X_test[:3].values, 'label': y_test[:3].values})
train_samples, test_samples
<del>_</del>_
                     message
                              label
                exact intent
                         one
      2 lololo ok next time
                                   α.
                                                    message label
                                           u download fring
         pass di ur contact n see wat u luv wid put smi...
                                                                  0
                                                                  0)
from sklearn.feature extraction.text import TfidfVectorizer
# Initialize TF-IDF Vectorizer
vectorizer = TfidfVectorizer(max_features=5000)
# Fit and transform training data, transform test data
X_train_vec = vectorizer.fit_transform(X_train)
X_{\text{test\_vec}} = \text{vectorizer.transform}(X_{\text{test}})
# Show the shape of transformed data
X_train_vec.shape, X_test_vec.shape
→ ((4135, 4376), (1034, 4376))
Exploratory Data Analysis
df.sample(10)
```

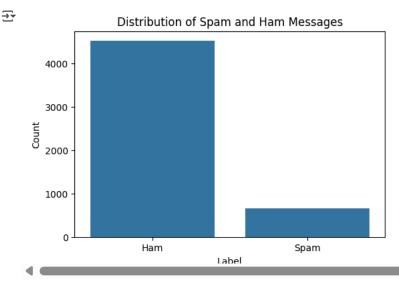


df['label'].value_counts()



```
import matplotlib.pyplot as plt
import seaborn as sns

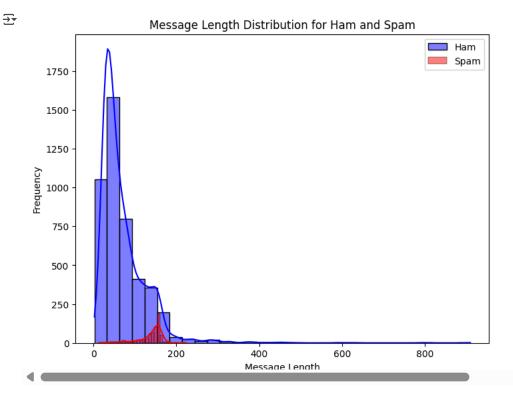
# Plot distribution of spam vs ham messages
plt.figure(figsize=(6, 4))
sns.countplot(x='label', data=df)
plt.title('Distribution of Spam and Ham Messages')
plt.xlabel('Label')
plt.xlabel('Count')
plt.xticks([0, 1], ['Ham', 'Spam'])
plt.show()
```



```
# Display the length of messages for spam vs ham
df['message_length'] = df['message'].apply(len)

plt.figure(figsize=(8, 6))
sns.histplot(df[df['label'] == 0]['message_length'], color='blue', label='Ham', kde=True, bins=30)
sns.histplot(df[df['label'] == 1]['message_length'], color='red', label='Spam', kde=True, bins=30)
plt.title('Message Length Distribution for Ham and Spam')
plt.xlabel('Message Length')
plt.ylabel('Frequency')
```

plt.legend()
plt.show()



import nltk

!pip install nltk

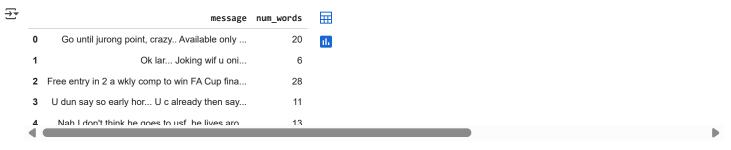
Requirement already satisfied: nltk in /usr/local/lib/python3.11/dist-packages (3.9.1)
Requirement already satisfied: click in /usr/local/lib/python3.11/dist-packages (from nltk) (8.1.8)
Requirement already satisfied: joblib in /usr/local/lib/python3.11/dist-packages (from nltk) (1.4.2)
Requirement already 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)

df.head()

₹	la	bel	message	cleaned_message	message_length				
	0	0	Go until jurong point, crazy Available only	go jurong avail bugi n great world la e cine g	111	11.			
	1	0	Ok lar Joking wif u oni	ok joke wif u	29				
	2	1	Free entry in 2 a wkly comp to win FA Cup fina	free entri wkli comp win fa cup final tkt may	155				
	3	0	U dun say so early hor U c already then say	u dun say earli u c alreadi	49				
	4	n	Nah I don't think he ones to usf he lives aro	nah think doe live around though	61	•			
Next steps: Generate code with df View recommended plots New interactive sheet									

```
# Add a new column for the number of words in each message
df['num_words'] = df['message'].apply(lambda x: len(x.split()))
```

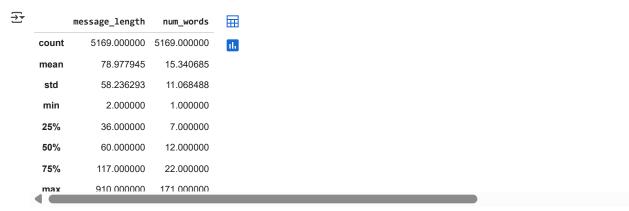
```
# Display the first few rows with the new column
df[['message', 'num_words']].head()
```



df.sample(12)

ength num_words	message_length	cleaned_message	message	label		label	
10	54	go bath msg next	I'm going for bath will msg you next <#>	372 0			
8	31	money steve	I have no money 4 steve mate!!	0	4533 0 5278 1		
23	144	mobil number award prize call land claim valid	URGENT! Your Mobile number has been awarded wi	1			
7	33	k k watch	K k :-):-) then watch some films.	0	3177		
12	51	dai send resum	Dai what this da Can i send my resume to thi	0	2497		
11	55	well qualiti aint bad aint complain	Lol. Well quality aint bad at all so i aint co	0	1731		
2	19	ur lectur	Is ur lecture over?	0	3138		
64	297	hope would send rent due dont enough reserv co	I had been hoping i would not have to send you	0	3105		
33	160	gal n boy walk hold ur u think would run jst w	Gal n boy walking in d park. gal-can i hold ur	0	5325		
25	160	poli tone mob direct rpli poli titl eg poli ymca	Gr8 Poly tones 4 ALL mobs direct 2u rply with	1	2816		
30	169	case u r come cochin pl call bfore u shall als	Dear,Me at cherthala.in case u r coming cochin	0	687		
18	106	monthli amount terribl nav anvth till finish	The monthly amount is not that terrible and vo	n	2538		

df[['cleaned_message','message_length','num_words']].describe()

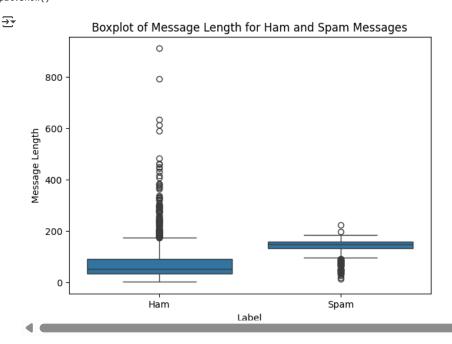


ham
df[df['label'] == 0][['message_length','num_words']].describe()

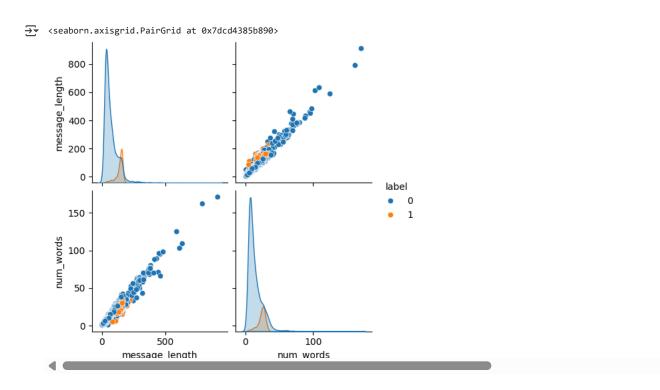
_		message_length	num_words	
	count	4516.000000	4516.000000	
	mean	70.459256	14.134632	
	std	56.358207	11.116240	
	min	2.000000	1.000000	
	25%	34.000000	7.000000	
	50%	52.000000	11.000000	
	75%	90.000000	18.000000	
	max	910 000000	171 000000	

```
# spam
df[df['label'] == 1][['message_length','num_words']].describe()
<del>_</del>
             message_length num_words
                                             ☶
      count
                  653.000000
                              653.000000
      mean
                  137.891271
                                23.681470
       std
                   30.137753
                                 5.967672
       min
                    13.000000
                                 2.000000
                  132.000000
                                22.000000
       25%
       50%
                  149.000000
                                25.000000
       75%
                  157.000000
                                28.000000
       max
                  224 000000
                                35 000000
# Check for outliers in num_words using a boxplot
plt.figure(figsize=(8, 6))
sns.boxplot(x='label', y='num_words', data=df)
plt.title('Boxplot of Number of Words for Ham and Spam Messages')
plt.xlabel('Label')
plt.ylabel('Number of Words')
plt.xticks([0, 1], ['Ham', 'Spam'])
plt.show()
# Show the top 5 messages with the most words
top_5_longest_messages = df[['message', 'num_words']].sort_values(by='num_words', ascending=False).head(5)
top_5_longest_messages
Boxplot of Number of Words for Ham and Spam Messages
         175
                                   0
                                    0
         150
         125
                                    0
                                    00000
      Number of Words
          100
           75
           50
           25
            0
                                  Ham
                                                                             Spam
                                                       Label
                                                                        \blacksquare
                                                 message num_words
      1084
                 For me the love should start with attraction.i...
                                                                 171
      1862
               The last thing i ever wanted to do was hurt yo...
                                                                 162
      2157 Sad story of a Man - Last week was my b'day. M...
                                                                 125
      2433
                Indians r poor but India is not a poor country...
                                                                 109
      1578
                 How to Make a dirl Happy? It's not at all diff
                                                                 103
              Generate code with top_5_longest_messages
 Next steps:
                                                           View recommended plots
                                                                                          New interactive sheet
#Plotting message_length
# Check for outliers in message length using a boxplot
```

```
plt.figure(figsize=(7, 5))
sns.boxplot(x='label', y='message_length', data=df)
plt.title('Boxplot of Message Length for Ham and Spam Messages')
plt.xlabel('Label')
plt.ylabel('Message Length')
plt.xticks([0, 1], ['Ham', 'Spam'])
plt.show()
```

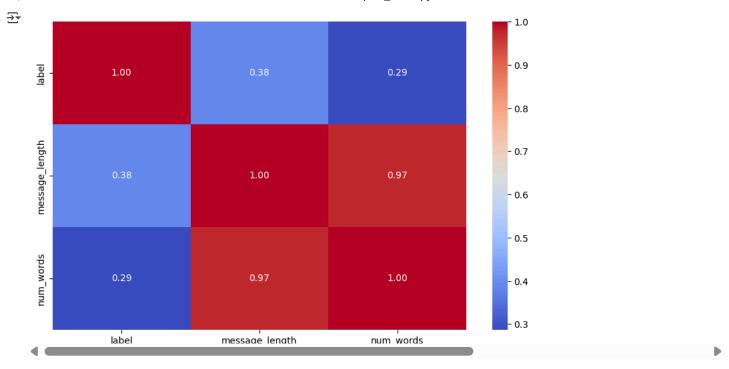


sns.pairplot(df,hue='label')



```
# Select only numeric columns
numeric_df = df.select_dtypes(include=['number'])

# Compute and plot correlation matrix
plt.figure(figsize=(10,6))
sns.heatmap(numeric_df.corr(), annot=True, cmap='coolwarm', fmt='.2f')
plt.show()
```



```
# Display the number of rows and columns
shape = df.shape
# Display the column names
columns = df.columns
# Display the first 5 rows of the dataset
head = df.head()
shape, columns, head
<del>_</del>__
    ((5169, 5),
      Index(['label', 'message', 'cleaned_message', 'message_length', 'num_words'], dtype='object'),
                                                          message \
               Go until jurong point, crazy.. Available only ...
                                    Ok lar... Joking wif u oni...
     1
             a
     2
             1 Free entry in 2 a wkly comp to win FA Cup fina...
     3
             0 U dun say so early hor... U c already then say...
     4
             0 Nah I don't think he goes to usf, he lives aro...
                                           cleaned_message message_length \
        go jurong avail bugi n great world la e cine g...
                                                                       111
                                             ok joke wif u
                                                                        29
     2
        free entri wkli comp win fa cup final tkt may ...
                                                                        155
                                                                        49
                               u dun say earli u c alreadi
     4
                          nah think goe live around though
                                                                        61
         num_words
                20
                6
     1
     2
                28
     3
                11
     4
                13 )
current_shape = df.shape
current_shape
→ (5169, 5)
```

Model Training

```
from sklearn.model_selection import train_test_split, cross_val_score from sklearn.svm import SVC from sklearn.ensemble import RandomForestClassifier
```

import xgboost as xgb
from sklearn.metrics import accuracy_score, classification_report, confusion_matrix
from sklearn.feature_extraction.text import TfidfVectorizer

df.sample(15)

num_words	message_length	cleaned_message	message	label	
6	38	good morn happi new	Good morning princess! Happy New Year!	0	3595
9	52	sister clear two round birla soft	My sister cleared two round in birla soft yest	0	344
4	27	super msg	Super msg da:)nalla timing.	0	2672
6	29	mean	If You mean the website. Yes.	0	4044
24	161	congratul ur award either yr suppli cd virgin	Congratulations ur awarded either a yrs supply	1	865
26	120	hurri home u big hang last caller u food done ask	Hurry home u big butt. Hang up on your last ca	0	3274
18	87	wot peopl r cribb	You know, wot people wear. T shirts, jumpers,	0	5549
10	55	ugh hope asu ppl dont randomli	Ugh hopefully the asus ppl dont randomly do a	0	3167
9	36	ask u meet da ge tmr	I ask if u meeting da ge tmr nite	0	5411
14	73	friend tyler liter ask could get dubsack	Haha, my friend tyler literally just asked if	0	4548
6	30	custom place call	Customer place i will call you	0	3140
25	134	took hooch walk toaday fell graze knee stay see	We took hooch for a walk toaday and i fell ove	0	4914
24	114	btw regard realli tri see anyon els guy commit	Btw regarding that we should really try to see	0	2436
19	156	im inperialmus weirdest track ever byåóleafcut	Im in inperialmusic listening2the weirdest tra	0	1265
21	91	oh wav food want do meal	Oh and hy the way you do have more food in you	n	302

df.head()

₹	lab	el	message	cleaned_message	message_length	num_words	
	0	0	Go until jurong point, crazy Available only go jurong a	vail bugi n great world la e cine g	111	20	11.
	1	0	Ok lar Joking wif u oni	ok joke wif u	29	6	
	2	1	Free entry in 2 a wkly comp to win FA Cup fina free entri w	vkli comp win fa cup final tkt may	155	28	
	3	0	U dun say so early hor U c already then say	u dun say earli u c alreadi	49	11	
	4	n	Nah I don't think he does to usf, he lives aro	nah think doe live around thoudh	61	13	•
Next	steps:	G	enerate code with df	ew interactive sheet			

```
# Split the data into features and target
X = df['cleaned_message']
```

Vectorize the data
vectorizer = TfidfVectorizer(max_features=5000)
X_vec = vectorizer.fit_transform(X)

Split the data into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(X_vec, y, test_size=0.2, random_state=42)

Initialize the models
svm_model = SVC()
rf_model = RandomForestClassifier(n_estimators=100)
xgb_model = xgb.XGBClassifier()

Train the models
svm_model.fit(X_train, y_train)
rf_model.fit(X_train, y_train)
xgb_model.fit(X_train, y_train)

y = df['label']

```
▶ XGBClassifier
# Make predictions
svm_pred = svm_model.predict(X_test)
rf_pred = rf_model.predict(X_test)
xgb pred = xgb model.predict(X test)
# Evaluate the models
svm_accuracy = accuracy_score(y_test, svm_pred)
rf_accuracy = accuracy_score(y_test, rf_pred)
xgb_accuracy = accuracy_score(y_test, xgb_pred)
svm_report = classification_report(y_test, svm_pred)
rf_report = classification_report(y_test, rf_pred)
xgb_report = classification_report(y_test, xgb_pred)
svm_conf_matrix = confusion_matrix(y_test, svm_pred)
rf_conf_matrix = confusion_matrix(y_test, rf_pred)
xgb_conf_matrix = confusion_matrix(y_test, xgb_pred)
# Cross-validation scores
svm_cv_scores = cross_val_score(svm_model, X_vec, y, cv=5)
rf_cv_scores = cross_val_score(rf_model, X_vec, y, cv=5)
xgb_cv_scores = cross_val_score(xgb_model, X_vec, y, cv=5)
svm_accuracy, rf_accuracy, xgb_accuracy, svm_report, rf_report, xgb_report, svm_conf_matrix, rf_conf_matrix, xgb_conf_matrix, svm_cv_scores.
→ (0.9661508704061895,
      0.9690522243713733,
      0.9613152804642167,
                     precision
                                   recall f1-score
                                                                             0
                                                                                     0.97
                                                      support\n\n
                                                                                                1.00
                                                                                                          0.98
                                                                                                                      889\n
     0.97
               0.78
                         0.87
                                     145\n\n
                                                accuracy
                                                                                    0.97
                                                                                               1034\n
                                                                                                        macro avg
                                                                                                                         0.97
     0.92
               1034\nweighted avg
                                         0.97
                                                   0.97
                                                              0.96
                                                                        1034\n',
                                                                                                                      889\n
                                   recall f1-score
                                                      support\n\n
                                                                                     0.97
                                                                                                1.00
                                                                                                          0.98
                     precision
                                                                             0
     0.99
               0.79
                         0.88
                                     145\n\n
                                                                                    0.97
                                                                                               1034\n
                                                                                                                         0.98
                                                accuracy
                                                                                                        macro avg
     0.93
               1034\nweighted avg
                                         0.97
                                                   0.97
                                                              0.97
                                                                        1034\n',
                                   recall f1-score
                                                                                     0.97
                                                                                                0.99
                                                                                                          0.98
                                                                                                                      889\n
                     precision
                                                      support\n\n
                                                                             0
     0.91
               0.81
                         0.85
                                     145\n\n
                                                accuracy
                                                                                    0.96
                                                                                               1034\n
                                                                                                        macro avg
                                                                                                                         0.94
     0.92
               1034\nweighted avg
                                         0.96
                                                    0.96
                                                              0.96
                                                                        1034\n',
      array([[886,
                     3],
             [ 32, 113]])
      array([[888, 1],
             [ 31, 114]]),
      array([[877, 12],
             [ 28, 117]]),
      np.float64(0.9651757009030802),
      np.float64(0.9653702479679287),
      np.float64(0.9620812978292742))
# Gather results
results = {
    "svm_accuracy": svm_accuracy,
    "rf_accuracy": rf_accuracy,
    "xgb_accuracy": xgb_accuracy,
    "svm_report": svm_report,
    "rf_report": rf_report,
    "xgb_report": xgb_report,
    "svm_conf_matrix": svm_conf_matrix,
    "rf_conf_matrix": rf_conf_matrix,
    "xgb_conf_matrix": xgb_conf_matrix,
    "svm_cv_mean": svm_cv_scores.mean(),
    "rf_cv_mean": rf_cv_scores.mean(),
    "xgb_cv_mean": xgb_cv_scores.mean()
}
results
{'svm_accuracy': 0.9661508704061895,
  'rf_accuracy': 0.9690522243713733,
```

1

1

1

0.89

0.89

0.90

```
'xgb_accuracy': 0.9613152804642167, 'svm_report': ' precis:
                          precision recall f1-score
                                                                                             1.00
                                                                                                                 889\n
                                                         support\n\n
                                                                                     0.97
                                                                                                       0.98
     0.97
                0.78
                          0.87 145\n\n accuracy
                                                                              0.97
                                                                                       1034\n macro avg
                                                                                                               0.97
                                                                                                                        0.89
       1034\nweighted avg
                                0.97 0.97
                                                            1034\n',
0.92
                                                 0.96
                                                                                                                889\n
                                     recall f1-score
                                                                                    0.97
 'rf_report':
                          precision
                                                                                            1.00
                                                                                                      0.98
                                                        support\n\n
       0.99
               0.79
                                                                              0.97
                                                                                                                        0.89
                         0.88 145\n\n accuracy
                                                                                       1034\n macro avg
                                                                                                               0.98
0.93
       1034\nweighted avg
                                0.97
                                       0.97
                                                 0.97
                                                            1034\n',
'xgb_report': '
                           precision
                                       recall f1-score
                                                                                     0.97
                                                                                              0.99
                                                                                                       0.98
                                                                                                                 889\n
                                                         support \\ \\ n\\ \\ n
     0.91
               0.81
                         0.85
                                   145\n\n
                                                                              0.96
                                                                                       1034\n macro avg
                                                                                                               0.94
                                                                                                                        0.90
                                0.96
                                         0.96
0.92
       1034\nweighted avg
                                                  0.96
                                                            1034\n',
 'svm_conf_matrix': array([[886,
                                3],
      [ 32, 113]]),
 'rf_conf_matrix': array([[888,
```