```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model selection import train_test_split
from sklearn.preprocessing import LabelEncoder
from keras.models import Model
from keras.layers import LSTM, Activation, Dense, Dropout, Input, Embedding
from keras.optimizers import RMSprop
from keras.preprocessing.text import Tokenizer
from keras.preprocessing import sequence
from keras.utils import to categorical
from keras.callbacks import EarlyStopping
import tensorflow
%matplotlib inline
from tensorflow.keras.preprocessing.sequence import pad sequences
df = pd.read csv('spam.csv',delimiter=',',encoding='latin-1')
df.head()
     v1
                                        v2 Unnamed: 2 Unnamed: 3 Unnamed: 4
           Go until jurong point, crazy.. Available only ...
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                                                             NaN
                                                                        NaN
    ham
    ham
                         Ok lar... Joking wif u oni...
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                                                             NaN
                                                                        NaN
   spam Free entry in 2 a wkly comp to win FA Cup fina...
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                                                             NaN
                                                                        NaN
 3
           U dun say so early hor... U c already then say...
                                                  NaN
                                                             NaN
                                                                        NaN
    ham
            Nah I don't think he goes to usf, he lives aro...
                                                             NaN
                                                                        NaN
    ham
                                                  NaN
df.drop(['Unnamed: 2', 'Unnamed: 3', 'Unnamed: 4'],axis=1,inplace=True)
df.info()
RangeIndex: 5572 entries, 0 to 5571
Data columns (total 2 columns):
    Column Non-Null Count Dtype
             -----
     _____
```

1 v2 5572 non-null object dtypes: object(2) memory usage: 87.2+ KB sns.countplot(df.v1)

5572 non-null

plt.xlabel('Label')

0

v1

plt.title('Number of ham and spam messages')

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWar ning: Pass the following variable as a keyword arg: x. From version 0.12, t he only valid positional argument will be `data`, and passing other argumen

object

ts without an explicit keyword will result in an error or misinterpretation . Future $\mbox{Warning}$

Text(0.5, 1.0, 'Number of ham and spam messages')

```
Number of ham and spam messages

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```
X = df.v2
Y = df.v1
le = LabelEncoder()
Y = le.fit transform(Y)
Y = Y.reshape(-1,1)
X_train, X_test, Y_train, Y_test = train_test_split(X, Y, test_size=0.15)
max words = 1000
max len = 150
tok = Tokenizer(num words=max words)
tok.fit on texts(X train)
sequences = tok.texts_to_sequences(X_train)
def RNN():
    inputs = Input(name='inputs',shape=[max len])
    layer = Embedding(max_words,50,input_length=max_len)(inputs)
    layer = LSTM(64) (layer)
    layer = Dense(256, name='FC1') (layer)
    layer = Activation('relu')(layer)
    layer = Dropout(0.5)(layer)
    layer = Dense(1, name='out layer')(layer)
    layer = Activation('sigmoid')(layer)
    model = Model(inputs=inputs,outputs=layer)
    return model
model = RNN()
model.summary()
model.compile(loss='binary crossentropy',optimizer=RMSprop(),metrics=['accu
racy'])
```

Model: "model"

Layer (type)	Output Shape	Param #
inputs (InputLayer)	[(None, 150)]	0
embedding (Embedding)	(None, 150, 50)	50000
lstm (LSTM)	(None, 64)	29440
FC1 (Dense)	(None, 256)	16640
activation (Activation)	(None, 256)	0

```
dropout (Dropout)
                           (None, 256)
out layer (Dense)
                           (None, 1)
                                                    257
activation 1 (Activation)
                          (None, 1)
______
Total params: 96,337
Trainable params: 96,337
Non-trainable params: 0
df.columns
Index(['v1', 'v2'], dtype='object')
data=df.rename(
   "v1": "Category",
   "v2": "Message"
},
   axis=1
)
df.info()
RangeIndex: 5572 entries, 0 to 5571
Data columns (total 2 columns):
# Column Non-Null Count Dtype
    -----
   v1
Ω
           5572 non-null object
1 v2
           5572 non-null object
dtypes: object(2)
memory usage: 87.2+ KB
data["Message Length"] = data["Message"].apply(len)
fig=plt.figure(figsize=(12,8))
sns.histplot(
   x=data["Message Length"],
   hue=data["Category"]
)
plt.title("ham & spam messege length comparision")
plt.show()
              ham & spam messege length comparision
                                   Category
ham
  700
  600
  500
```

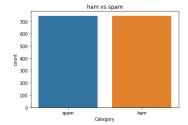
ham desc=data[data["Category"]=="ham"]["Message Length"].describe()

5572 2 ham	5572 5169	5572.000000 NaN
	5169	NaN
ham		
	Sorry, I'll call later	NaN
4825	30	NaN
NaN	NaN	80.118808
NaN	NaN	59.690841
NaN	NaN	2.000000
NaN	NaN	36.000000
NaN	NaN	61.000000
NaN	NaN	121.000000
NaN	NaN	910.000000
egory'	"].value_count	cs()
747 egory, plot(data, tegory	y"	1
	A825 NaN NaN NaN NaN NaN NaN Aegory 1825 747 2egory 2edata, ategory	NaN NaN Regory"].value_count 825 747 regory, dtype: int64 cplot(cdata, ctegory" e("ham vs spam")

```
ham vs spam

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```
ham count=data["Category"].value counts()[0]
spam count=data["Category"].value counts()[1]
total count=data.shape[0]
print("Ham contains:{:.2f}% of total
data.".format(ham count/total count*100))
print("Spam contains:{:.2f}% of total
data.".format(spam_count/total_count*100))
Ham contains:86.59% of total data.
Spam contains:13.41% of total data.
minority_len=len(data[data["Category"]=="spam"])
majority_len=len(data[data["Category"]=="ham"])
minority_indices=data[data["Category"]=="spam"].index
majority indices=data[data["Category"]=="ham"].index
random majority indices=np.random.choice(
    majority indices,
    size=minority len,
    replace=False
undersampled indices=np.concatenate([minority indices,random majority indic
df=data.loc[undersampled indices]
df=df.sample(frac=1)
df=df.reset index()
df=df.drop(
    columns=["index"],
df.shape
 (1494, 3)
df["Category"].value counts()
        747
spam
        747
ham
Name: Category, dtype: int64
sns.countplot(
    data=df,
    x="Category"
plt.title("ham vs spam")
plt.show()
```



df.head()

(Category	Message	Message Length
0	spam	Dear Voucher Holder, To claim this weeks offer	152
1	ham	I cant pick the phone right now. Pls send a me	51
2	spam	TheMob>Hit the link to get a premium Pink Pant	149
3	spam	URGENT This is our 2nd attempt to contact U. Y	136
4	spam	449050000301 You have won a å£2,000 price! To	70
df[":	Label"]	=df["Category"].map(
	{ "h -		
		am":0, pam":1	
	}		
)			
df.h	ead()		

	Category	Message	Message Length	Label
0	spam	Dear Voucher Holder, To claim this weeks offer	152	1
1	ham	I cant pick the phone right now. Pls send a me	51	0
2	spam	TheMob>Hit the link to get a premium Pink Pant	149	1
3	spam	URGENT This is our 2nd attempt to contact U. Y	136	1
4	spam	449050000301 You have won a å£2,000 price! To	70	1

```
import re
import nltk
from nltk.corpus import stopwords
from nltk.stem import PorterStemmer
stemmer=PorterStemmer()
corpus=[]
for message in df["Message"]:
    message=re.sub("[^a-zA-Z]"," ",message)
    message=message.lower()
    message=message.split()
from tensorflow.keras.preprocessing.text import one hot
vocab size=10000
oneHot doc=[one hot(words,n=vocab size)
           for words in corpus
df["Message Length"].describe()
         1494.000000
count
mean
          105.296519
          57.379967
std
min
           2.000000
25%
          49.000000
50%
          120.000000
75%
          153.000000
max
          450.000000
Name: Message Length, dtype: float64
fig=plt.figure(figsize=(12,8))
sns.kdeplot(
    x=df["Message Length"],
    hue=df["Category"]
)
plt.title("ham & spam messege length comparision")
plt.show()
  0.012
  0.010
  0.008
  0.004
  0.002
```

```
from tensorflow.keras.preprocessing.sequence import pad_sequences
sentence_len=200
embedded_doc=pad_sequences(
    oneHot_doc,
```

```
maxlen=sentence len,
    padding="pre"
)
extract features=pd.DataFrame(
    data=embedded doc
)
target=df["Label"]
df final=pd.concat([extract features,target],axis=1)
df final.head()
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5 \text{ rows} \times 201 \text{ columns}
X=df final.drop("Label",axis=1)
y=df final["Label"]
from sklearn.model_selection import train_test_split
    Х,
    У,
    random state=37,
    test size=0.2
X train, X val, y train, y val=train test split(
    X trainval,
    y trainval,
    random_state=37,
    test size=0.2
```

```
model = RNN()
model.summary()
model.compile(loss='binary_crossentropy',optimizer=RMSprop(),metrics=['accu
racy'])
Model: "model_1"
```

Layer (type)	Output Shape	Param #
inputs (InputLayer)	[(None, 150)]	0
embedding_1 (Embedding)	(None, 150, 50)	50000
lstm_1 (LSTM)	(None, 64)	29440
FC1 (Dense)	(None, 256)	16640
activation_2 (Activation)	(None, 256)	0
dropout_1 (Dropout)	(None, 256)	0
out_layer (Dense)	(None, 1)	257
activation_3 (Activation)	(None, 1)	0

Total params: 96,337 Trainable params: 96,337 Non-trainable params: 0