In [14]: Fake_data

Out[14]:

	title	text	subject	date	category	category_numeric
0	Donald Trump Sends Out Embarrassing New Year'	Donald Trump just couldn t wish all Americans	News	December 31, 2017	fake	0
1	Drunk Bragging Trump Staffer Started Russian	House Intelligence Committee Chairman Devin Nu	News	December 31, 2017	fake	0
2	Sheriff David Clarke Becomes An Internet Joke	On Friday, it was revealed that former Milwauk	News	December 30, 2017	fake	0
3	Trump Is So Obsessed He Even Has Obama's Name	On Christmas day, Donald Trump announced that	News	December 29, 2017	fake	0
4	Pope Francis Just Called Out Donald Trump Dur	Pope Francis used his annual Christmas Day mes	News	December 25, 2017	fake	0
23476	McPain: John McCain Furious That Iran Treated	21st Century Wire says As 21WIRE reported earl	Middle- east	January 16, 2016	fake	0
23477	JUSTICE? Yahoo Settles E-mail Privacy Class-ac	21st Century Wire says It s a familiar theme	Middle- east	January 16, 2016	fake	0
23478	Sunnistan: US and Allied 'Safe Zone' Plan to T	Patrick Henningsen 21st Century WireRemember	Middle- east	January 15, 2016	fake	0
23479	How to Blow \$700 Million: Al Jazeera America F	21st Century Wire says Al Jazeera America will	Middle- east	January 14, 2016	fake	0
23480	10 U.S. Navy Sailors Held by Iranian Military	21st Century Wire says As 21WIRE predicted in	Middle- east	January 12, 2016	fake	0

23481 rows × 6 columns

```
In [15]: list(Fake_data)
Out[15]: ['title', 'text', 'subject', 'date', 'category', 'category_numeric']
In [9]: type(Fake_data.category)
Out[9]: pandas.core.series.Series
In [10]: True_data["category"] = "real"
In [12]: True_data["category_numeric"] = 1
```

```
In [13]: full data = pd.concat([Fake data,True data], axis =0)
 In [20]: X = full_data[['title', 'text', 'subject', 'date']]
 In [16]: | y = full data['category numeric']
 In [27]: #one hot encoding
          le = LabelEncoder()
          Y = le.fit transform(y)
          Y = Y.reshape(-1,1)
 In [28]: X_train,X_test,Y_train,Y_test = train_test_split(X,Y,test_size=0.2)
 In [33]: print(X_train.shape)
          print(Y_train.shape)
          (35918, 4)
          (35918, 1)
 In [34]:
          print(X_test.shape)
          print(Y_test.shape)
          (8980, 4)
          (8980, 1)
 In [36]:
          from keras.preprocessing.text import Tokenizer
          from keras.preprocessing import sequence
          max words = 1000
          \max len = 150
          tok = Tokenizer(num words=max words)
          tok.fit on texts(X train.text)
          sequences = tok.texts to sequences(X train.text)
          sequences_matrix = sequence.pad_sequences(sequences,maxlen=max_len)
In [107]: | sequences matrix
Out[107]: array([[ 22, 69, 79, ..., 495, 49,
                             0, ..., 718, 20, 222],
                 [ 0,
                         0,
                        59,
                             7, ..., 446, 944, 200],
                 [728,
                        0, 0, ..., 16, 1,
                 [ 0,
                   1, 162, 11, ..., 242, 495,
                                                49],
                 [ 5, 76, 401, ..., 10, 311, 608]])
```

```
In [38]: from keras.models import Model
from keras.layers import LSTM, Activation, Dense, Dropout, Input, Embedding

def LSTMKerasModel():
    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
```

In [40]: from keras.optimizers import Adam model = LSTMKerasModel() model.summary() model.compile(loss='binary_crossentropy', optimizer=Adam(lr=0.005),metrics=['accuracy'])

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_1 (Activation)	(None, 256)	0
dropout_1 (Dropout)	(None, 256)	0
out_layer (Dense)	(None, 1)	257
activation_2 (Activation)	(None, 1)	0

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

```
In [42]:
       from keras.callbacks import EarlyStopping
       %matplotlib inline
       model.fit(sequences matrix,Y train,batch size=128,epochs=10,
               validation split=0.2, callbacks=[EarlyStopping(monitor='val loss', min
       _delta=0.0001)])
       C:\Users\veena\Anaconda3\lib\site-packages\tensorflow core\python\framework\i
       ndexed slices.py:424: UserWarning: Converting sparse IndexedSlices to a dense
       Tensor of unknown shape. This may consume a large amount of memory.
         "Converting sparse IndexedSlices to a dense Tensor of unknown shape. "
       Train on 28734 samples, validate on 7184 samples
       Epoch 1/10
       28734/28734 [============== ] - 37s 1ms/step - loss: 0.1500 -
       accuracy: 0.9452 - val_loss: 0.0929 - val_accuracy: 0.9688
       Epoch 2/10
       accuracy: 0.9626 - val loss: 0.0845 - val accuracy: 0.9741
       Epoch 3/10
       accuracy: 0.9729 - val_loss: 0.0606 - val_accuracy: 0.9811
       Epoch 4/10
       accuracy: 0.9758 - val loss: 0.0596 - val accuracy: 0.9788
       Epoch 5/10
       28734/28734 [============= ] - 38s 1ms/step - loss: 0.0494 -
       accuracy: 0.9835 - val loss: 0.0588 - val accuracy: 0.9819
       accuracy: 0.9858 - val loss: 0.0420 - val accuracy: 0.9825
       Epoch 7/10
       28734/28734 [============= ] - 39s 1ms/step - loss: 0.0261 -
       accuracy: 0.9910 - val loss: 0.0261 - val accuracy: 0.9911
       Epoch 8/10
       accuracy: 0.9943 - val loss: 0.0252 - val accuracy: 0.9929
       Epoch 9/10
       accuracy: 0.9957 - val loss: 0.0264 - val accuracy: 0.9922
Out[42]: <keras.callbacks.callbacks.History at 0x1de280d8bc8>
In [43]: test sequences = tok.texts to sequences(X test.text)
       test sequences matrix = sequence.pad sequences(test sequences, maxlen=max len)
In [44]: accr = model.evaluate(test sequences matrix,Y test)
```

```
In [45]: | print('Test set\n Loss: {:0.3f}\n Accuracy: {:0.3f}'.format(accr[0],accr[1
          ]))
          Test set
            Loss: 0.044
            Accuracy: 0.989
In [56]: | type(X_test)
Out[56]: pandas.core.frame.DataFrame
In [118]:
         import numpy as np
          Y test
          dem = [1, 0, 1]
          dem_Y = le.fit_transform(dem)
          dem Y = dem Y.reshape(-1,1)
          text = ["Jeanne Shaheen is the current senetor of New hampshire", "Joe Biden d
          ied in 48 seconds due to major heart attack", "Jeanne Shaheen is the current se
          netor of New hampshire"]
          dem X = pd.DataFrame(data = text)
          dem X.columns = ['text']
In [119]: dem
Out[119]: [1, 0, 1]
          demo_seq = tok.texts_to_sequences(dem_X.text)
In [120]:
          demo seq matrix = sequence.pad sequences(demo seq,maxlen=max len)
          demo acc = model.evaluate(demo seq matrix,dem Y)
          3/3 [======== ] - 0s 5ms/step
         print('Test set\n Loss: {:0.3f}\n Accuracy: {:0.3f}'.format(demo acc[0],demo
In [121]:
          _acc[1]))
          Test set
            Loss: 2.786
            Accuracy: 0.333
In [122]: | ynew = model.predict(demo seq matrix, verbose=1)
          3/3 [======= ] - 0s 4ms/step
In [123]:
         ynew
Out[123]: array([[0.01533068],
                 [0.00139869],
                 [0.01533068]], dtype=float32)
In [76]: from keras.utils import to categorical
          Y_train = to_categorical(Y_train)
```

```
In [103]: def LSTMKerasModel Dense2():
              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(2,name='out layer')(layer)
              layer = Activation('sigmoid')(layer)
              model = Model(inputs=inputs,outputs=layer)
              return model
          model_dense2 = LSTMKerasModel_Dense2()
          model dense2.summary()
          model_dense2.compile(loss='binary_crossentropy', optimizer=Adam(lr=0.005),metr
          ics=['accuracy'])
          model_dense2.fit(sequences_matrix,Y_train,batch_size=128,epochs=5,
                     validation_split=0.2,callbacks=[EarlyStopping(monitor='val_loss',min
          delta=0.0001)])
```

Model: "model 6"

Layer (type)	Output Shape	Param #
inputs (InputLayer)	(None, 150)	0
embedding_6 (Embedding)	(None, 150, 50)	50000
lstm_6 (LSTM)	(None, 64)	29440
FC1 (Dense)	(None, 256)	16640
activation_11 (Activation)	(None, 256)	0
dropout_6 (Dropout)	(None, 256)	0
out_layer (Dense)	(None, 2)	514
activation_12 (Activation)	(None, 2)	0
Tatal manager 06 504		

Total params: 96,594 Trainable params: 96,594 Non-trainable params: 0

C:\Users\veena\Anaconda3\lib\site-packages\tensorflow_core\python\framework\i
ndexed_slices.py:424: UserWarning: Converting sparse IndexedSlices to a dense
Tensor of unknown shape. This may consume a large amount of memory.

"Converting sparse IndexedSlices to a dense Tensor of unknown shape. "

Out[103]: <keras.callbacks.callbacks.History at 0x1de43f24d88>

```
In [104]: test_sequences = tok.texts_to_sequences(X_test.text)
    test_sequences_matrix = sequence.pad_sequences(test_sequences,maxlen=max_len)

Y_test_cat = to_categorical(Y_test)
    accr = model_dense2.evaluate(test_sequences_matrix,Y_test_cat)

print('Test_set\n Loss: {:0.3f}\n Accuracy: {:0.3f}'.format(accr[0],accr[1]))
```

```
8980/8980 [============== ] - 6s 657us/step
Test set
Loss: 0.161
Accuracy: 0.956
```

```
In [105]:
         demo_seq = tok.texts_to_sequences(dem_X.text)
         demo_seq_matrix = sequence.pad_sequences(demo_seq,maxlen=max_len)
         dem_cat_Y = to_categorical(dem_Y)
         demo_acc = model_dense2.evaluate(demo_seq_matrix,dem_cat_Y)
         print('Test set\n Loss: {:0.3f}\n Accuracy: {:0.3f}'.format(demo_acc[0],demo
          _acc[1]))
         2/2 [======= ] - 0s 7ms/step
         Test set
           Loss: 0.657
           Accuracy: 0.500
In [106]:
         model_dense2.predict(demo_seq_matrix,verbose=1)
         2/2 [======] - 0s 32ms/step
Out[106]: array([[0.6373239 , 0.3556639 ],
                [0.7495553 , 0.25324905]], dtype=float32)
 In [ ]:
```