```
import warnings
import re
import pickle
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
import tensorflow as tf
from tensorflow import keras
from keras.layers import Dense, Flatten, BatchNormalization, Dropout, Bidirectional, LSTM, GRU, Embedding
from keras.models import Model, Sequential
from keras.callbacks import EarlyStopping
from keras.utils import plot_model
from keras.preprocessing.text import Tokenizer
from \ keras.preprocessing.sequence \ import \ pad\_sequences
from sklearn.model_selection import train_test_split
from sklearn.feature_extraction.text import TfidfVectorizer, CountVectorizer
import nltk
nltk.download('all')
```

```
[nltk_data]
                    Downloading package ycoe to /root/nltk_data...
                        Unzipping corpora/ycoe.zip.
     [nltk data]
     [nltk_data]
     [nltk_data] Done downloading collection all
     True
df = pd.read_csv("/content/eng_fr.csv")
df.head()
         English words/sentences French words/sentences
      0
                              Hi.
                                                    Salut!
      1
                             Run!
                                                   Cours!
      2
                             Run!
                                                  Courez!
      3
                            Who?
                                                     Qui?
      4
                            Wow!
                                                 Ça alors!
df.rename(columns = {'English words/sentences':'English', 'French words/sentences':'French'}, inplace=True)
df.head()
         English
                   French
      0
              Hi.
                     Salut!
      1
            Run!
                    Cours!
      2
            Run!
                   Courez!
      3
           Who?
                     Qui?
           Wow! Ça alors!
df.shape
     (175621, 2)
df.isna().sum()
     English
                0
     French
     dtype: int64
df.duplicated().sum()
     0
df2 = df.sample(frac = 1)
df.shape
     (175621, 2)
df.head()
         English
                    French
      0
              Hi.
                     Salut!
      1
            Run!
                    Cours!
      2
            Run!
                   Courez!
      3
           Who?
                     Qui?
      4
           Wow! Ça alors!
df2.shape
```

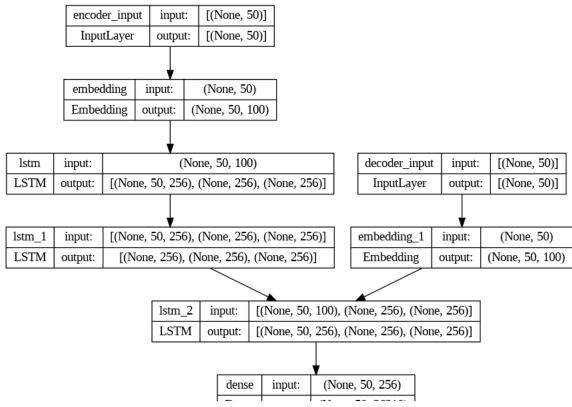
https://colab.research.google.com/drive/1a6p--TnR1FGrlj0zcbDBvxXkg7Vh3ZTE#scrollTo=wy8dv-2k8Ulp&printMode=true

```
(175621, 2)
```

```
df2.head()
                                    English
                                                                             French
      109390
                I never stop thinking about you.
                                                           Je ne cesse de penser à toi.
       9972
                            Are you winning?
                                                                         Tu gagnes?
       33529
                         Dating is exhausting.
                                                   Sortir avec des garçons est épuisant.
      117653 We must take care of the elderly. On doit prendre soin des personnes âgées.
       58185
                     What happens after that?
                                                         Que s'est-il passé après cela ?
df2.reset_index(inplace = True, drop = True)
df2.head()
                              English
                                                                        French
          I never stop thinking about you.
                                                     Je ne cesse de penser à toi.
      1
                       Are you winning?
                                                                   Tu gagnes?
                    Dating is exhausting.
      2
                                              Sortir avec des garçons est épuisant.
         We must take care of the elderly. On doit prendre soin des personnes âgées.
      4
                                                   Que s'est-il passé après cela ?
                What happens after that?
english = df2['English'][:50000]
french = df2['French'][:50000]
english.shape
     (50000,)
def cleaning_process(text):
  text = text.lower()
  text = re.sub(re.compile("[^a-z!?',]"), '', text)
  text = nltk.word_tokenize(text)
  text = " ".join([i.strip() for i in text])
  return text
english_cleaned = english.apply(lambda x: cleaning_process(x))
french_cleaned = french.apply(lambda x: cleaning_process(x))
store_eng = set()
store_french = set()
for x in english:
  for word in x.split(' '):
    if word not in store_eng:
      store_eng.add(word)
for x in french:
  for word in x.split(' '):
    if word not in store_french:
      store_french.add(word)
len(store_eng)
     16528
len(store_french)
     26559
```

```
english_sent = english.apply(lambda x: len(x.split()))
french_sent = french.apply(lambda x: len(x.split()))
max_english_sent = max(english_sent)
max_french_sent = max(french_sent)
print("english: ", max_english_sent)
print("french: ", max_french_sent)
     english: 44
     french: 55
english_vocab = 16370
french_vocab = 26310
english\_sentence\_max = 50
french_sentence_max = 50
make_tokens = Tokenizer()
make_tokens.fit_on_texts(english)
encoded_english = make_tokens.texts_to_sequences(english)
padded_english = pad_sequences(encoded_english, maxlen=english_sentence_max, padding='post')
padded_english
     array([[ 1, 95, 198, ...,
                                            0,
                                                  0],
                    2, 1780, ...,
              20,
                                      0,
                                            0,
                                                  0],
            [1689,
                     6, 4391, ...,
                                      0,
                                                  0],
                                            0,
            [ 73,
                    75,
                          2, ...,
                                            0,
                                                  0],
                    55, 848, ...,
               1,
                                      0.
                                            0.
                                                  0]], dtype=int32)
              22,
                     5, 299, ...,
                                      0,
                                            0,
padded_english.shape
     (50000, 50)
make_tokens.fit_on_texts(french)
encoded french = make tokens.texts to sequences(french)
padded_french = pad_sequences(encoded_french, maxlen=french_sentence_max, padding='post')
padded_french
                3,
                      13, 2528, ...,
     array([[
                                                        0],
               16, 18085,
                            0, ...,
                                                        0],
                                          0.
                                                 0.
            [ 643,
                      79,
                             63, ...,
                                          0,
                                                 0,
                                                        0],
           ...,
[ 3, 72,
r 3, 26025,
                      72, 4325, ...,
                                          0,
                                                 0,
                                                        0],
                            12, ...,
                                          0,
                                                 0,
                                                        0],
            [ 267, 397, 878, ...,
                                                 0,
                                                        0]], dtype=int32)
padded_french.shape
     (50000, 50)
X_train, X_test, y_train, y_test = train_test_split(padded_english, padded_french, test_size = 0.2, shuffle = True, random_state = 100)
X train.shape
     (40000, 50)
y_train.shape
     (40000, 50)
X_train
     array([[ 35, 131, 7399, ...,
                                            0,
                                                  0],
              72, 141,
                                      0,
                                                  0],
                           8, ...,
                                            0.
                   220,
             23,
                                                  0],
            [ 13,
                     6,
                           4, ...,
```

```
4, ..., 0,
74, ..., 0,
               26, 190,
                                             0,
                                                   0],
                    2, 74, ...,
                                                   0]], dtype=int32)
                                             0.
               86.
y_train
                             748, ...,
     array([[
               242,
                                                  0,
                                                         0],
                             803, ...,
                                           0,
               839,
                       17,
                                                  0,
                                                         0],
                       43, 22959, ...,
                 3,
            [ 54,
                       15, 1037, ...,
                                                         0],
               54,
                            62, ...,
                                           0,
                                                         0],
                       24.
                                                  0.
               914,
                       10,
                              18, ...,
                                           0,
                                                  0,
                                                         0]], dtype=int32)
max_len = 50
#encoder layer
encoder_input = keras.Input(shape=(max_len,), name = "encoder_input")
embedd = Embedding(input_dim=english_vocab, output_dim=100, input_length= english_sentence_max)(encoder_input)
encoder_lstm = LSTM(256,activation="tanh",return_sequences=True,return_state=True)(embedd)
encoder_lstm2 = LSTM(256,activation="tanh",return_state=True)(encoder_lstm)
_, state_h , state_c = encoder_lstm2
encoder_states = [state_h , state_c]
#decoder layer
decoder_input = keras.Input(shape=(max_len,), name="decoder_input")
decoder_embed = Embedding(input_dim=french_vocab, output_dim = 100, input_length = french_sentence_max)(decoder_input)
decoder_lstm = LSTM(256, activation="tanh", return_sequences=True, return_state=True)
decoder_outputs , _ , _ = decoder_lstm(decoder_embed, initial_state = encoder_states)
decoder_dense = Dense(french_vocab, activation='softmax')
outputs = decoder_dense(decoder_outputs)
model = Model([encoder_input, decoder_input], outputs)
model.summarv()
     Model: "model"
      Layer (type)
                                  Output Shape
                                                                Param #
                                                                          Connected to
      encoder_input (InputLayer) [(None, 50)]
                                                                          []
      embedding (Embedding)
                                  (None, 50, 100)
                                                               1637000
                                                                          ['encoder_input[0][0]']
      decoder_input (InputLayer) [(None, 50)]
                                                                0
      1stm (LSTM)
                                  [(None, 50, 256),
                                                                365568
                                                                          ['embedding[0][0]']
                                   (None, 256),
                                   (None, 256)]
      embedding_1 (Embedding)
                                  (None, 50, 100)
                                                               2631000
                                                                          ['decoder_input[0][0]']
      lstm_1 (LSTM)
                                  [(None, 256),
                                                                          ['lstm[0][0]',
                                                                525312
                                   (None, 256),
                                                                            lstm[0][1]',
                                                                           'lstm[0][2]']
                                   (None, 256)]
      1stm_2 (LSTM)
                                  [(None, 50, 256),
                                                                365568
                                                                          ['embedding_1[0][0]',
                                    (None, 256),
                                                                           'lstm_1[0][1]
                                                                           'lstm_1[0][2]']
                                   (None, 256)]
      dense (Dense)
                                  (None, 50, 26310)
                                                               6761670
                                                                         ['lstm_2[0][0]']
     Total params: 12286118 (46.87 MB)
     Trainable params: 12286118 (46.87 MB)
     Non-trainable params: 0 (0.00 Byte)
call = EarlyStopping(patience=10)
compiled = model.compile(optimizer='rmsprop', loss='sparse_categorical_crossentropy', metrics=['accuracy'])
plot_model(model, to_file='modelsummary.png', show_shapes=True, show_layer_names=True)
```

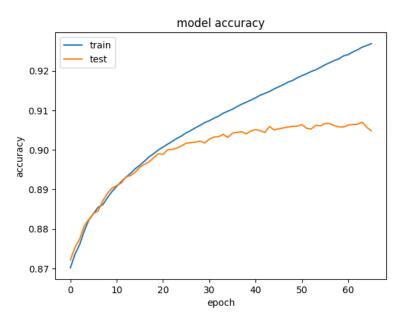


history = model.fit([X_train, X_train], y_train , validation_data=([X_test, X_test], y_test) ,epochs = 100, callbacks = call, verbose = True)

```
Enoch 2/100
1250/1250 [
                                  ====] - 102s 81ms/step - loss: 0.9094 - accuracy: 0.8736 - val_loss: 0.8944 - val_accuracy: 0.87
Epoch 3/100
1250/1250 [====
                                       - 102s 81ms/step - loss: 0.8806 - accuracy: 0.8761 - val loss: 0.8709 - val accuracy: 0.87
Epoch 4/100
1250/1250 [
                                         100s 80ms/step - loss: 0.8575 - accuracy: 0.8795 - val_loss: 0.8528 - val_accuracy: 0.88
Epoch 5/100
1250/1250 [
                                         100s 80ms/step - loss: 0.8382 - accuracy: 0.8823 - val_loss: 0.8409 - val_accuracy: 0.88
Epoch 6/100
1250/1250 [
                                         93s 74ms/step - loss: 0.8221 - accuracy: 0.8839 - val_loss: 0.8310 - val_accuracy: 0.883
Enoch 7/100
1250/1250 [=
                                       - 100s 80ms/step - loss: 0.8076 - accuracy: 0.8855 - val_loss: 0.8286 - val_accuracy: 0.88
Epoch 8/100
1250/1250 [==
                                       - 100s 80ms/step - loss: 0.7983 - accuracy: 0.8861 - val loss: 0.7989 - val accuracy: 0.88
Epoch 9/100
1250/1250 [=
                                         100s 80ms/step - loss: 0.7803 - accuracy: 0.8879 - val_loss: 0.7852 - val_accuracy: 0.88
Epoch 10/100
1250/1250 [=====
                                       - 101s 80ms/step - loss: 0.7657 - accuracy: 0.8895 - val loss: 0.7722 - val accuracy: 0.89
Epoch 11/100
1250/1250 [=
                                        100s 80ms/step - loss: 0.7523 - accuracy: 0.8908 - val_loss: 0.7624 - val_accuracy: 0.89
Epoch 12/100
1250/1250 [=
                                         100s 80ms/step - loss: 0.7392 - accuracy: 0.8920 - val_loss: 0.7533 - val_accuracy: 0.89
Epoch 13/100
1250/1250 [=
                                       - 93s 74ms/step - loss: 0.7269 - accuracy: 0.8931 - val_loss: 0.7417 - val_accuracy: 0.893
Epoch 14/100
1250/1250 [=
                                        93s 74ms/step - loss: 0.7152 - accuracy: 0.8941 - val_loss: 0.7356 - val_accuracy: 0.895
Epoch 15/100
1250/1250 [===
                                       - 101s 81ms/step - loss: 0.7035 - accuracy: 0.8952 - val loss: 0.7273 - val accuracy: 0.89
Epoch 16/100
1250/1250 [=
                                       - 93s 75ms/step - loss: 0.6921 - accuracy: 0.8961 - val_loss: 0.7145 - val_accuracy: 0.895
Epoch 17/100
1250/1250 [====
                                       - 100s 80ms/step - loss: 0.6810 - accuracy: 0.8971 - val loss: 0.7064 - val accuracy: 0.89
Epoch 18/100
1250/1250 [=
                                        101s 81ms/step - loss: 0.6701 - accuracy: 0.8982 - val_loss: 0.6993 - val_accuracy: 0.89
Epoch 19/100
1250/1250 [=
                                         100s 80ms/step - loss: 0.6594 - accuracy: 0.8990 - val_loss: 0.6894 - val_accuracy: 0.89
Epoch 20/100
1250/1250 [=
                                         99s 79ms/step - loss: 0.6489 - accuracy: 0.9000 - val_loss: 0.6833 - val_accuracy: 0.899
Epoch 21/100
1250/1250 [=
                                       - 92s 74ms/step - loss: 0.6386 - accuracy: 0.9007 - val_loss: 0.6806 - val_accuracy: 0.898
Epoch 22/100
Epoch 23/100
1250/1250 [=
                                =====] - 92s 74ms/step - loss: 0.6189 - accuracy: 0.9021 - val_loss: 0.6648 - val_accuracy: 0.900
Epoch 24/100
```

```
============] - 99s 79ms/step - loss: 0.6095 - accuracy: 0.9029 - val_loss: 0.6587 - val_accuracy: 0.90(💂
     1250/1250 [==
    Epoch 25/100
     1250/1250 [================] - 92s 74ms/step - loss: 0.6003 - accuracy: 0.9035 - val_loss: 0.6531 - val_accuracy: 0.901
     Epoch 26/100
                                ========] - 99s 79ms/step - loss: 0.5914 - accuracy: 0.9043 - val_loss: 0.6517 - val_accuracy: 0.901
     1250/1250 [=
     Epoch 27/100
     1250/1250 [==
                              ========] - 100s 80ms/step - loss: 0.5827 - accuracy: 0.9049 - val_loss: 0.6439 - val_accuracy: 0.90
     Epoch 28/100
                              ========] - 92s 74ms/step - loss: 0.5741 - accuracy: 0.9056 - val_loss: 0.6402 - val_accuracy: 0.90%
     1250/1250 [==
     Epoch 29/100
model.save('my_model.keras')
                                                                                                                                   history.history.keys()
     dict_keys(['loss', 'accuracy', 'val_loss', 'val_accuracy'])
```

```
# summarize history for accuracy
plt.plot(history.history['accuracy'])
plt.plot(history.history['val_accuracy'])
plt.title('model accuracy')
plt.ylabel('accuracy')
plt.xlabel('epoch')
plt.legend(['train', 'test'], loc='upper left')
plt.show()
```



```
# summarize history for loss
plt.plot(history.history['loss'])
plt.plot(history.history['val_loss'])
plt.title('model loss')
plt.ylabel('loss')
plt.xlabel('epoch')
plt.legend(['train', 'test'], loc='upper left')
plt.show()
```

model loss

```
train
         1.0
                   test
         0.9
         0.8
with open('model_pkl', 'wb') as files:
    pickle.dump(model, files)
            def preprocess(lines):
 text = cleaning_process(str(lines))
 make_tokens.fit_on_texts(text)
 encoded_text = make_tokens.texts_to_sequences(text)
 padded_text = pad_sequences(encoded_text, maxlen=english_sentence_max, padding='post')
 prediction = model.predict([padded_text, padded_text])
 output_translation = np.argmax(prediction,axis=-1)
 output_sentence = []
 for i in output_translation[0]:
      if i in make_tokens.index_word:
          output_sentence.append(make_tokens.index_word[i])
          output_sentence.append(' ')
 return ' '.join(output_sentence)
input_sentence = "What happens after that?"
translated = preprocess(input_sentence)
print(f"Input: {input_sentence}")
print(f"Translated: {translated}")
```