```
import pandas as pd
import re
import tensorflow as tf
from tensorflow.keras.layers import Embedding, LSTM, Dense
from tensorflow.keras.models import Model
from tensorflow.keras.preprocessing.text import Tokenizer
from tensorflow.keras.preprocessing.sequence import pad_sequences
import numpy as np
import nltk.translate.bleu_score as bleu
import random
import string
from sklearn.model_selection import train_test_split
import os
import time
```

```
from google.colab import drive
drive.mount('/content/drive')
```

```
Mounted at /content/drive
```

```
eng_hin=pd.read_csv('/content/drive/MyDrive/PRL/task/data/synthetic-dataset/train.csv')
eng_hin.head()
```

	English	Hindi	Hinglish	Average rating	Disagreement
0	Program module is a file that contains instruc...	माड्यूल, एक संचिका होती है, जिसमें या तो स्रोत...	module , ek program hoti hai , jismen ya to so...	7	6
1	And to Thamud We sent their brother Sali 'h. H...	और (हमने) क़ौमे समूद के पास उनके भाई सालेह को ...	aur hamne aume samood ke pas unke bhaee saleh ...	6	4
2	and, when reminded, do not remember\n	और जब उन्हें याद दिलाया जाता है, तो वे याद नही...	aur jab unhen yad dilaya jata hai , to ve yad ...	10	0
3	you won the TED Prize 2011.\n	तुम्हें २०११ का टेड प्राइज़ मिल गया है.\n	tumhen २०११ ka ted prize mil gaya hai\n	9	1
4	He gone to Kerodemal College of Delhi Universi...	उन्होंने बाद अध्ययन करने के लिए ये दिल्ली विश्...	unhonne bad science karne ke lie ye delhi univ...	7	0

```
# create a new dataframe of english and hinglish column
df = pd.DataFrame()
df["english"] = eng_hin["English"]
df["hindi"] = eng_hin["Hindi"]
df.head()
```

	english	hindi
0	Program module is a file that contains instruc...	माड्यूल, एक संचिका होती है, जिसमें या तो स्रोत...
1	And to Thamud We sent their brother Sali 'h. H...	और (हमने) क़ौमे समूद के पास उनके भाई सालेह को ...
2	and, when reminded, do not remember\n	और जब उन्हें याद दिलाया जाता है, तो वे याद नही...
3	you won the TED Prize 2011.\n	तुम्हें २०११ का टेड प्राइज़ मिल गया है.\n
4	He gone to Kerodemal College of Delhi Universi...	उन्होंने बाद अध्ययन करने के लिए ये दिल्ली विश्...

```
eng_hin.dropna(inplace=True)
eng_hin.shape
```

```
(2766, 7)
```

```
exclude = set(string.punctuation) # Set of all special characters
remove_digits = str.maketrans('', '', string.digits) # Set of all digits
```

```
def preprocess(text):
    '''Function to preprocess English sentence'''
    text = text.lower() # lower casing
    text = re.sub("'", '', text) # remove the quotation marks if any
    text = ''.join(ch for ch in text if ch not in exclude)
```

```
    text = text.translate(remove_digits) # remove the digits
    text = text.strip()
    text = re.sub(" +", " ", text) # remove extra spaces
    text = '<start> ' + text + ' <end>'
    return text
```

```
def preprocess_hin(text):
    '''Function to preprocess Marathi sentence'''
    text = re.sub("'", '', text) # remove the quotation marks if any
    text = ''.join(ch for ch in text if ch not in exclude)
    text = re.sub("[२३०८१५७९४६]", "", text) # remove the digits
    text = text.strip()
    text = re.sub(" +", " ", text) # remove extra spaces
    text = '<start> ' + text + ' <end>'
    return text
```

```
eng_hin['english'] = df['english'].apply(preprocess)
eng_hin['hindi'] = df['hindi'].apply(preprocess_hin)

eng_hin.rename(columns={"english": "english", "hindi": "hindi"},inplace=True)

eng_hin.head()
```

	English	Hindi	Hinglish	Average rating	Disagreement	english	hindi
0	Program module is a file that contains instruc...	माड्यूल, एक संचिका होती है, जिसमें या तो स्रोत...	module , ek program hoti hai , jismen ya to so...	7	6	<start> program module is a file that contains...	<start> माड्यूल एक संचिका होती है जिसमें या तो...
1	And to Thamud We sent their brother Sali 'h. H...	और (हमने) क़ौमे समूद के पास उनके भाई सालेह को ...	aur hamne aume samood ke pas unke bhaee saleh ...	6	4	<start> and to thamud we sent their brother sa...	<start> और हमने क़ौमे समूद के पास उनके भाई साल...
2	and, when reminded, do not remember\n	और जब उन्हें याद दिलाया जाता है, तो वे याद नही...	aur jab unhen yad dilaya jata hai , to ve yad ...	10	0	<start> and when reminded do not remember <end>	<start> और जब उन्हें याद दिलाया जाता है तो वे ...
3	you won the TED Prize 2011.\n	तुम्हें २०११ का टेड प्राइज़ मिल गया है.\n	tumhen २०११ ka ted prize mil gaya hai\n	9	1	<start> you won the ted prize <end>	<start> तुम्हें का टेड प्राइज़ मिल गया है <end>
	He gone to	उन्होंने बाद	unhonne bad			<start> he gone to	<start> उन्होंने

```
def tokenize(lang):

  lang_tokenizer = tf.keras.preprocessing.text.Tokenizer(filters='')
  lang_tokenizer.fit_on_texts(lang)

  tensor = lang_tokenizer.texts_to_sequences(lang)

  tensor = tf.keras.preprocessing.sequence.pad_sequences(tensor,padding='post',maxlen=20,dtype='int32')

  return tensor, lang_tokenizer
```

```
def load_dataset():

  input_tensor, inp_lang_tokenizer = tokenize(eng_hin['english'].values)
  target_tensor, targ_lang_tokenizer = tokenize(eng_hin['hindi'].values)

  return input_tensor, target_tensor, inp_lang_tokenizer, targ_lang_tokenizer
```

```
input_tensor, target_tensor, inp_lang, targ_lang = load_dataset()
```

```
max_length_targ, max_length_inp = target_tensor.shape[1], input_tensor.shape[1]
```

```
input_tensor_train, input_tensor_val, target_tensor_train, target_tensor_val = train_test_split(input_tensor, target_te

print(len(input_tensor_train), len(target_tensor_train), len(input_tensor_val), len(target_tensor_val))
```

```
2212 2212 554 554
```

```
BUFFER_SIZE = len(input_tensor_train)
BATCH_SIZE = 32
N_BATCH = BUFFER_SIZE//BATCH_SIZE
embedding_dim = 256
units = 1024
steps_per_epoch = len(input_tensor_train)//BATCH_SIZE

vocab_inp_size =len(inp_lang.word_index.keys())
vocab_tar_size =len(targ_lang.word_index.keys())

dataset = tf.data.Dataset.from_tensor_slices((input_tensor_train, target_tensor_train)).shuffle(BUFFER_SIZE)
dataset = dataset.batch(BATCH_SIZE, drop_remainder=True)
```

```
embeddings_index = dict()
f = open('/content/drive/MyDrive/PRL/task/data/synthetic-dataset/glove.6B.300d.txt')
for line in f:
    values = line.split()
    word = values[0]
    coefs = np.asarray(values[1:], dtype='float32')
    embeddings_index[word] = coefs
f.close()

embedding_matrix = np.zeros((vocab_inp_size+1, 300))
for word, i in inp_lang.word_index.items():
    embedding_vector = embeddings_index.get(word)
    if embedding_vector is not None:
        embedding_matrix[i] = embedding_vector
```

```
class Encoder(tf.keras.Model):
    def __init__(self, vocab_size, embedding_dim, enc_units, batch_sz):
        super(Encoder, self).__init__()
        self.batch_sz = batch_sz
        self.enc_units = enc_units
        self.embedding = tf.keras.layers.Embedding(input_dim=vocab_size, output_dim=embedding_dim, name="embedding_layer
        self.gru = tf.keras.layers.GRU(units, return_sequences=True, return_state=True, recurrent_activation='sigmoid',

    def call(self, x, hidden):
        x = self.embedding(x)
        output, state = self.gru(x, initial_state = hidden)
        return output, state

    def initialize_hidden_state(self):
        return tf.zeros((self.batch_sz, self.enc_units))
```

```
class Decoder(tf.keras.Model):
    def __init__(self, vocab_size, embedding_dim, dec_units, batch_sz):
        super(Decoder, self).__init__()
        self.batch_sz = batch_sz
        self.dec_units = dec_units
        self.embedding = tf.keras.layers.Embedding(vocab_size, embedding_dim)
        self.gru = tf.keras.layers.GRU(units, return_sequences=True, return_state=True, recurrent_activation='sigmoid',
        self.fc = tf.keras.layers.Dense(vocab_size)

                # used for attention
        self.W1 = tf.keras.layers.Dense(self.dec_units)
        self.W2 = tf.keras.layers.Dense(self.dec_units)
        self.V = tf.keras.layers.Dense(1)

    def call(self, x, hidden, enc_output):

        hidden_with_time_axis = tf.expand_dims(hidden, 1)

        score = self.V(tf.nn.tanh(self.W1(enc_output) + self.W2(hidden_with_time_axis)))

        attention_weights = tf.nn.softmax(score, axis=1)

        context_vector = attention_weights * enc_output
        context_vector = tf.reduce_sum(context_vector, axis=1)

        x = self.embedding(x)

```

```
        x = tf.concat([tf.expand_dims(context_vector, 1), x], axis=-1)

        output, state = self.gru(x)

        output = tf.reshape(output, (-1, output.shape[2]))

        x = self.fc(output)

        return x, state, attention_weights

    def initialize_hidden_state(self):
        return tf.zeros((self.batch_sz, self.dec_units))
```

```
tf.keras.backend.clear_session()

encoder = Encoder(vocab_inp_size+1, 300, units, BATCH_SIZE)
decoder = Decoder(vocab_tar_size+1, embedding_dim, units, BATCH_SIZE)
```

```
optimizer = tf.keras.optimizers.Adam()
loss_object = tf.keras.losses.SparseCategoricalCrossentropy(from_logits=True,
                                                             reduction='none')


def loss_function(real, pred):
  mask = tf.math.logical_not(tf.math.equal(real, 0))
  loss_ = loss_object(real, pred)

  mask = tf.cast(mask, dtype=loss_.dtype)
  loss_ *= mask

  return tf.reduce_mean(loss_)
```

```
checkpoint_dir = './training_checkpoints'
checkpoint_prefix = os.path.join(checkpoint_dir, "ckpt")
checkpoint = tf.train.Checkpoint(optimizer=optimizer,
                                 encoder=encoder,
                                 decoder=decoder)
```

```
@tf.function
def train_step(inp, targ, enc_hidden):
  loss = 0

  with tf.GradientTape() as tape:
    enc_output, enc_hidden = encoder(inp, enc_hidden)
    encoder.get_layer('embedding_layer_encoder').set_weights([embedding_matrix])
    dec_hidden = enc_hidden

    dec_input = tf.expand_dims([targ_lang.word_index['<start>']] * BATCH_SIZE, 1)

    for t in range(1, targ.shape[1]):
      predictions, dec_hidden, _ = decoder(dec_input, dec_hidden, enc_output)

      loss += loss_function(targ[:, t], predictions)

      dec_input = tf.expand_dims(targ[:, t], 1)

  batch_loss = (loss / int(targ.shape[1]))

  variables = encoder.trainable_variables + decoder.trainable_variables

  gradients = tape.gradient(loss, variables)

  optimizer.apply_gradients(zip(gradients, variables))

  return batch_loss
```

```
EPOCHS = 100

for epoch in range(EPOCHS):
  start = time.time()

  enc_hidden = encoder.initialize_hidden_state()
```

```
  total_loss = 0

  for (batch, (inp, targ)) in enumerate(dataset.take(steps_per_epoch)):
    batch_loss = train_step(inp, targ, enc_hidden)
    total_loss += batch_loss

    if batch % 100 == 0:
      print(f'Epoch {epoch+1} Batch {batch} Loss {batch_loss.numpy():.4f}')
  if (epoch + 1) % 2 == 0:
    checkpoint.save(file_prefix=checkpoint_prefix)

  print(f'Epoch {epoch+1} Loss {total_loss/steps_per_epoch:.4f}')
  print(f'Time taken for 1 epoch {time.time()-start:.2f} sec\n')
```

```
Time taken for 1 epoch 8.04 sec

Epoch 87 Batch 0 Loss 0.0049
Epoch 87 Loss 0.0027
Time taken for 1 epoch 7.15 sec

Epoch 88 Batch 0 Loss 0.0048
Epoch 88 Loss 0.0031
Time taken for 1 epoch 8.04 sec

Epoch 89 Batch 0 Loss 0.0007
Epoch 89 Loss 0.0033
Time taken for 1 epoch 7.16 sec

Epoch 90 Batch 0 Loss 0.0033
Epoch 90 Loss 0.0027
Time taken for 1 epoch 7.95 sec

Epoch 91 Batch 0 Loss 0.0133
Epoch 91 Loss 0.0029
Time taken for 1 epoch 7.17 sec

Epoch 92 Batch 0 Loss 0.0006
Epoch 92 Loss 0.0030
Time taken for 1 epoch 8.25 sec

Epoch 93 Batch 0 Loss 0.0007
Epoch 93 Loss 0.0040
Time taken for 1 epoch 7.18 sec

Epoch 94 Batch 0 Loss 0.0142
Epoch 94 Loss 0.0036
Time taken for 1 epoch 7.92 sec

Epoch 95 Batch 0 Loss 0.0327
Epoch 95 Loss 0.0062
Time taken for 1 epoch 7.18 sec

Epoch 96 Batch 0 Loss 0.0008
Epoch 96 Loss 0.0111
Time taken for 1 epoch 7.93 sec

Epoch 97 Batch 0 Loss 0.0160
Epoch 97 Loss 0.0155
Time taken for 1 epoch 7.20 sec

Epoch 98 Batch 0 Loss 0.0259
Epoch 98 Loss 0.0537
Time taken for 1 epoch 7.94 sec

Epoch 99 Batch 0 Loss 0.0447
Epoch 99 Loss 0.1171
Time taken for 1 epoch 7.19 sec

Epoch 100 Batch 0 Loss 0.1225
Epoch 100 Loss 0.1011
Time taken for 1 epoch 7.96 sec
```

```
def evaluate(sentence):
  attention_plot = np.zeros((max_length_targ, max_length_inp))

  sentence = preprocess(sentence)

  inputs = [inp_lang.word_index[i] for i in sentence.split(' ')]
  inputs = tf.keras.preprocessing.sequence.pad_sequences([inputs],maxlen=20, padding='post')
```

```
  inputs = tf.convert_to_tensor(inputs)

  result = ''

  hidden = [tf.zeros((1, units))]
  enc_out, enc_hidden = encoder(inputs, hidden)

  dec_hidden = enc_hidden
  dec_input = tf.expand_dims([targ_lang.word_index['<start>']], 0)

  for t in range(max_length_targ):
    predictions, dec_hidden, attention_weights = decoder(dec_input,
                                                         dec_hidden,
                                                         enc_out)
    # storing the attention weights to plot later on
    attention_weights = tf.reshape(attention_weights, (-1, ))
    attention_plot[t] = attention_weights.numpy()
    predicted_id = tf.argmax(predictions[0]).numpy()

    result += targ_lang.index_word[predicted_id] + ' '

    if targ_lang.index_word[predicted_id] == '<end>':
      return result,attention_plot

    # the predicted ID is fed back into the model
    dec_input = tf.expand_dims([predicted_id], 0)

  return result,attention_plot
```

```
input_sentence= 'please ensure that you use the appropriate form '
print('Input sentence in english : ',input_sentence)
predicted_output,attention_plot=evaluate(input_sentence)
print('Predicted sentence in hindi : ',predicted_output)
```

```
Input sentence in english :  please ensure that you use the appropriate form
Predicted sentence in hindi :  आपकी मांग को बदलने का गाना मंजूर किया हुआ <end>
```

```
input_sentence='and do something with it to change the world '
print('Input sentence in english : ',input_sentence)
predicted_output,attention_plot=evaluate(input_sentence)
print('Predicted sentence in hindi : ',predicted_output)
```

```
Input sentence in english :  and do something with it to change the world
Predicted sentence in hindi :  और अगर मालूम हो <end>
```

OpenInAPP sentences output

```
input_sentence='So even if its a big video I will clearly mention all the products '
print('Input sentence in english : ',input_sentence)
predicted_output,attention_plot=evaluate(input_sentence)
print('Predicted sentence in hindi : ',predicted_output)
```

```
Input sentence in english :  So even if its a big video I will clearly mention all the products
Predicted sentence in hindi :  तो सच है <end>
```

```
input_sentence='I was waiting for my bag '
print('Input sentence in english : ',input_sentence)
predicted_output,attention_plot=evaluate(input_sentence)
print('Predicted sentence in hindi : ',predicted_output)
```

```
Input sentence in english :  I was waiting for my bag
Predicted sentence in hindi :  मैंने मैं धैर्य न छूट जाए। <end>
```

```

```

```
input_sentence='definitely share your feedback in the comment section '
print('Input sentence in english : ',input_sentence)
predicted_output,attention_plot=evaluate(input_sentence)
print('Predicted sentence in hindi : ',predicted_output)
```

```
Input sentence in english :  definitely share your feedback in the comment section
---------------------------------------------------------------------------
KeyError                                  Traceback (most recent call last)
<ipython-input-66-854b97a97912> in <cell line: 3>()
      1 input_sentence='definitely share your feedback in the comment section '
      2 print('Input sentence in english : ',input_sentence)
----> 3 predicted_output,attention_plot=evaluate(input_sentence)
      4 print('Predicted sentence in hindi : ',predicted_output)

                                  1 frames
<ipython-input-61-4ac5775c6a63> in <listcomp>(.0)
      4   sentence = preprocess(sentence)
      5
----> 6   inputs = [inp_lang.word_index[i] for i in sentence.split(' ')]
      7   inputs =
tf.keras.preprocessing.sequence.pad_sequences([inputs],maxlen=20, padding='post')
      8   inputs = tf.convert_to_tensor(inputs)

KeyError: 'definitely'

SEARCH STACK OVERFLOW
```

1