Automated Essay Scoring

What is this Notebook about?

- This Notebook contains all raw results and experiments done with the various deep learning me results that we got. The whole Notebook may take approximately 5-6 hours. This Notebook cont
- Preprocess data
- · Important util methods to be used later
- Deep Learning Model declaration
- Running bert for individual sets
- Running bert for whole dataset
- Running word2vec for individual sets
- Running word2vec for whole dataset

```
# import important libraries and download data
import os
import pandas as pd
import numpy as np
import nltk
import re
from nltk.corpus import stopwords
from gensim.models import Word2Vec
from sklearn.model selection import train test split
from sklearn.model selection import KFold
from sklearn.metrics import cohen kappa score
import torch
import torch.nn as nn
import torch.nn.functional as F
import torch.optim as optim
import random
import multiprocessing
%matplotlib notebook
import numpy as np
import matplotlib.pyplot as plt
from sklearn.manifold import TSNE
nltk.download('punkt')
nltk.download('stopwords')
nltk.download('wordnet')
! git clone https://github.com/Gaurav-Pande/AES DL.git && mv AES DL/data .
! pip install transformers
```

```
[nltk data] Downloading package punkt to /root/nltk data...
  [nltk data] Unzipping tokenizers/punkt.zip.
  [nltk data] Downloading package stopwords to /root/nltk data...
  [nltk data] Unzipping corpora/stopwords.zip.
  [nltk data] Downloading package wordnet to /root/nltk data...
  [nltk data] Unzipping corpora/wordnet.zip.
  Cloning into 'AES_DL'...
  remote: Enumerating objects: 24, done.
  remote: Counting objects: 100% (24/24), done.
  remote: Compressing objects: 100% (20/20), done.
  remote: Total 24 (delta 4), reused 13 (delta 0), pack-reused 0
  Unpacking objects: 100% (24/24), done.
# Declaring some visualization methods to plot accuracy and model diagram
def plot accuracy curve(history):
  import matplotlib.pyplot as plt
 plt.plot(history.history['loss'])
  plt.plot(history.history['mae'])
  plt.title('Model loss')
 plt.ylabel('Loss')
 plt.xlabel('Epoch')
  plt.legend(['Train', 'Test'], loc='upper left')
 plt.show()
def plot acrchitecture(filename, model):
  from keras.utils import plot model
  plot model(model, to file=str(filename) + '.png')
# method to split data into sets
def split in sets(data):
   essay sets = []
   min scores = []
   max scores = []
    for s in range(1,9):
        essay set = data[data["essay set"] == s]
        essay set.dropna(axis=1, inplace=True)
        n, d = essay set.shape
        set scores = essay set["domain1 score"]
        print ("Set", s, ": Essays = ", n , "\t Attributes = ", d)
        min scores.append(set scores.min())
        max scores.append(set scores.max())
        essay sets.append(essay set)
    return (essay sets, min scores, max scores)
```

In the below cell, we can see the data we need to operate. We essentially drops the column, we dont n along with essay text.

```
dataset_path = "./data/training_set_rel3.tsv"
data = pd.read_csv(dataset_path, sep="\t", encoding="ISO-8859-1")
```

```
min\_scores = [2, 1, 0, 0, 0, 0, 0, 0]
\max_{scores} = [12, 6, 3, 3, 4, 4, 30, 60]
essay sets, data min scores, data max scores = split in sets(data)
set1, set2, set3, set4, set5, set6, set7, set8 = tuple(essay sets)
data.dropna(axis=1, inplace=True)
data.drop(columns=["rater1 domain1", "rater2 domain1"], inplace=True)
set1.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set2.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set3.drop(columns=["rater1 domain1", "rater2 domain1"], inplace=True)
set4.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set5.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set6.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set7.drop(columns=["rater1_domain1", "rater2_domain1"], inplace=True)
set8.drop(columns=["rater1 domain1", "rater2 domain1"], inplace=True)
sets = [set1,set2,set3,set4,set5,set6,set7,set8]
data.head()
```

/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:7: SettingWithCopyWa A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl import sys

/usr/local/lib/python3.6/dist-packages/pandas/core/frame.py:3997: SettingWithCopy A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stabl errors=errors,

| domain1_scc | essay | essay_set | essay_id | |
|-------------|--|-----------|----------|---|
| | Dear local newspaper, I think effects computer | 1 | 1 | 0 |
| | Dear @CAPS1 @CAPS2, I believe that using compu | 1 | 2 | 1 |
| | Dear, @CAPS1 @CAPS2 @CAPS3 More and more peopl | 1 | 3 | 2 |
| | Dear Local Newspaper, @CAPS1 I have found that | 1 | 4 | 3 |
| | Dear @LOCATION1, I know having computers has a | 1 | 5 | 4 |

There are named entity tags as you can see above, which can impact our model. so we need to removextend our stopwords set later on. But first we need to create all possible ner tags.

```
cap = ['@CAPS'+str(i) for i in range(100)]
loc = ['@LOCATION'+str(i) for i in range(100)]
```

```
org =['@ORGANIZATION'+str(i) for i in range(100)]
per = ['@PERSON'+str(i) for i in range(100)]
date = ['@DATE'+str(i) for i in range(100)]
time = ['@TIME'+str(i) for i in range(100)]
money = ['@MONEY'+str(i) for i in range(100)]
ner = cap + loc + org + per + date + time + money
```

Some utility functions declarations needed to convert the raw essay to word list.

```
import collections
top10 = collections.defaultdict(int)
def essay to wordlist(essay v, remove stopwords):
    """Remove the tagged labels and word tokenize the sentence."""
    essay v = re.sub("[^a-zA-Z]", " ", essay v)
    words = essay_v.lower().split()
    #top10 = collections.defaultdict(int)
    if remove stopwords:
        stops = stopwords.words("english")
        stops.extend(ner)
        for word in words:
          if word not in stops:
            # words.append(w)
            top10[word]+=1
        words = [w for w in words if not w in stops]
    return (words)
def essay_to_sentences(essay_v, remove_stopwords):
    """Sentence tokenize the essay and call essay to wordlist() for word tokenization
    tokenizer = nltk.data.load('tokenizers/punkt/english.pickle')
    raw sentences = tokenizer.tokenize(essay v.strip())
    sentences = []
    for raw sentence in raw sentences:
        if len(raw sentence) > 0:
            sentences.append(essay to wordlist(raw sentence, remove stopwords))
    return sentences
def makeFeatureVec(words, model, num features):
    """Make Feature Vector from the words list of an Essay."""
    featureVec = np.zeros((num features,),dtype="float32")
    num words = 0.
    index2word set = set(model.wv.index2word)
    for word in words:
        if word in index2word set:
            num words += 1
            featureVec = np.add(featureVec,model[word])
    featureVec = np.divide(featureVec, num words)
    return featureVec
def getAvgFeatureVecs(essays, model, num features):
    """Main function to generate the word vectors for word2vec model."""
```

```
counter = 0
essayFeatureVecs = np.zeros((len(essays),num_features),dtype="float32")
for essay in essays:
    essayFeatureVecs[counter] = makeFeatureVec(essay, model, num_features)
    counter = counter + 1
return essayFeatureVecs
```

Below we declare the model. here the model is of older version. for running the most recent version pl model_type as well in terms of hyperparameter.

```
from keras.layers import Embedding, Input, LSTM, Dense, Dropout, Lambda, Flatten, Bi
 from keras.models import Sequential, Model, load model, model from config
 import keras.backend as K
def get model(Hidden dim1=400, Hidden dim2=128, return sequences = True, dropout=0.5
     """Define the model."""
    model = Sequential()
     if bidirectional:
         model.add(Bidirectional(LSTM(Hidden dim1, return sequences=return sequences ,
         model.add(Bidirectional(LSTM(Hidden dim2, recurrent dropout=recurrent dropout
    else:
         model.add(LSTM(Hidden dim1, dropout=0.4, recurrent dropout=recurrent dropout
         model.add(LSTM(Hidden dim2, recurrent dropout=recurrent dropout))
    model.add(Dropout(dropout))
    model.add(Dense(1, activation=activation))
    model.compile(loss='mean squared error', optimizer='rmsprop', metrics=['mae'])
    model.summary()
     return model
 def get model CNN(Hidden dim1=400, Hidden dim2=128, return sequences = True, dropout
     """Define the model."""
    inputs = Input(shape=(768,1))
    x = ConvlD(64, 3, strides=1, padding='same', activation='relu')(inputs)
    #Cuts the size of the output in half, maxing over every 2 inputs
    x = MaxPooling1D(pool size=2)(x)
    x = Conv1D(128, 3, strides=1, padding='same', activation='relu')(x)
    x = GlobalMaxPooling1D()(x)
    outputs = Dense(output dims, activation='relu')(x)
    model = Model(inputs=inputs, outputs=outputs, name='CNN')
    model.compile(loss='mean squared error', optimizer='adam', metrics=['mae','mse']
    model.summary()
    return model
Using TensorFlow backend.
```

Below we will run the model for all sets using BERT

```
## Sets experiment BERT
```

```
THIPOT C CTHE
import torch
import transformers as ppb
import warnings
warnings.filterwarnings('ignore')
set count = 1
all sets score = []
for s in sets:
 print("\n----SET {}----\n".format(set count))
 X = s
 y = s['domain1 score']
 cv = KFold(n splits=5, shuffle=True)
  cv data = cv.split(X)
 results = []
 prediction list = []
  fold count =1
 cuda = torch.device('cuda')
  # For DistilBERT:
 model class, tokenizer class, pretrained weights = (ppb.DistilBertModel, ppb.Disti
  ## Want BERT instead of distilBERT? Uncomment the following line:
 ##model_class, tokenizer_class, pretrained_weights = (ppb.BertModel, ppb.BertToker
  # Load pretrained model/tokenizer
  tokenizer = tokenizer class.from pretrained(pretrained weights)
 model = model class.from pretrained(pretrained weights)
  with torch.cuda.device(cuda):
   for traincy, testcy in cy data:
      torch.cuda.empty cache()
      print("\n----Fold {}-----\n".format(fold count))
      # get the train and test from the dataset.
      X_train, X_test, y_train, y_test = X.iloc[traincv], X.iloc[testcv], y.iloc[traincv]
      train essays = X train['essay']
      #print("y train",y train)
      test essays = X test['essay']
      # model = model.cuda()
      #y train = torch.tensor(y train,dtype=torch.long)
      sentences = []
      tokenize sentences = []
      train bert embeddings = []
      #bert embedding = BertEmbedding()
      # for essay in train essays:
      # # get all the sentences from the essay
          sentences += essay to sentences(essay, remove stopwords = True)
      # sentences = pd.Series(sentences)
      # print(train essays)
      tokenized train = train essays.apply((lambda x: tokenizer.encode(x, add specia
      tokenized test = test essays.apply((lambda x: tokenizer.encode(x, add special
      ## train
      \max len = 0
      for i in tokenized train.values:
        if len(i) > max len:
```

```
max_len = len(i)
padded train = np.array([i + [0]*(max len-len(i)) for i in tokenized train.val
attention mask train = np.where(padded train != 0, 1, 0)
train_input_ids = torch.tensor(padded_train)
train_attention_mask = torch.tensor(attention_mask_train)
with torch.no grad():
  last hidden states train = model(train input ids, attention mask=train atter
train_features = last hidden states_train[0][:,0,:].numpy()
## test
\max len = 0
for i in tokenized test.values:
 if len(i) > max len:
   \max len = len(i)
padded test = np.array([i + [0]*(max len-len(i)) for i in tokenized test.value
attention_mask_test = np.where(padded_test != 0, 1, 0)
test_input_ids = torch.tensor(padded_test)
test attention mask = torch.tensor(attention mask test)
with torch.no grad():
  last_hidden_states_test = model(test_input_ids, attention_mask=test_attentic
test features = last hidden states test[0][:,0,:].numpy()
train x, train y = train features.shape
test x, test y = test features.shape
trainDataVectors = np.reshape(train features,(train x,1,train y))
testDataVectors = np.reshape(test features,(test x,1,test y))
lstm model = get model(bidirectional=False)
lstm model.fit(trainDataVectors, y train, batch size=128, epochs=70)
y pred = lstm model.predict(testDataVectors)
y pred = np.around(y pred)
#y pred.dropna()
np.nan to num(y pred)
# evaluate the model
result = cohen kappa score(y test.values,y pred,weights='quadratic')
print("Kappa Score: {}".format(result))
results.append(result)
fold count +=1
```

```
import tensorflow as tf
    tf.keras.backend.clear_session()

all_sets_score.append(results)
    print("Average kappa score value is : {}".format(np.mean(np.asarray(results))))
    set_count+=1
        # print(features.shape)
```

```
----SET 1-----
```

Downloading: 100% 232k/232k [00:00<00:00, 797kB/s]

Downloading: 100% 546/546 [00:09<00:00, 60.4B/s]

Downloading: 100% 268M/268M [00:08<00:00, 32.1MB/s]

```
Streaming output truncated to the last 5000 lines.
```

-----Fold 5----

Model: "sequential 1"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, | 128) | 270848 |
| dropout_1 (Dropout) | (None, | 128) | 0 |
| dense_1 (Dense) | (None, | 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |

Non-trainable params: 0

```
TPOCII ///0
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
Epoch 16/70
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Epoch 34/70
Epoch 35/70
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Epoch 36/70
Epoch 37/70
Epoch 38/70
Epoch 39/70
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Epoch 46/70
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Epoch 51/70
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Epoch 54/70
Epoch 55/70
Epoch 56/70
Epoch 57/70
Epoch 58/70
Epoch 59/70
Epoch 60/70
Epoch 61/70
Epoch 62/70
Epoch 63/70
Epoch 64/70
```

```
AES.ipynb - Colaboratory
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.4833040421792618
Average kappa score value is : 0.46397644382245506
----SET 3-----
-----Fold 1-----
Model: "sequential 1"
Layer (type)
          Output Shape
                     Param #
______
           (None, 1, 400)
lstm 1 (LSTM)
                     1870400
lstm 2 (LSTM)
                     270848
          (None, 128)
dropout 1 (Dropout)
           (None, 128)
dense 1 (Dense)
           (None, 1)
______
```

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70

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Epoch 12/70
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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
```

-----Fold 2-----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # |
|-------------------------|----------------|-----------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| m-1-1 2 141 277 | | ========= |
| Total params: 2,141,377 | | |

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70 Epoch 18/70

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Epoch 19/70
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TPOCII T///V
Epoch 48/70
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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.5787545787545787
```

-----Fold 3-----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|---|----------------|------------|
| ======================================= | | ========== |
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |

| | AES.ipynb - Colaboratory | |
|---|--------------------------|--------|
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | |
| 7 1 1 1 7 0 | | |

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Epoch 1/70
Epoch 2/70
Epoch 3/70
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Epoch 64/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6441930270145463
```

-----Fold 4-----

Model: "sequential 1"

Non-trainable params: 0

| Layer (type) | Output Shape | Param # |
|---|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 | | |

Epoch 2/70

1201/1201 - 1222 0 6261 ----

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Epoch 3/70
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Epoch 61/70
Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.561771061878289
```

-----Fold 5-----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # |
|---|----------------|------------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| ======================================= | | ========== |
| Total params: 2,141,377 | | |

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

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Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
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Phocii 2/10
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
Epoch 16/70
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Epoch 37/70
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Epoch 38/70
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Epoch 65/70
Epoch 66/70
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Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6056760482401757
Average kappa score value is: 0.5796103159922625
----SET 4-----
-----Fold 1-----
Model: "sequential 1"
```

| Layer (type) | Output Shape | Param # |
|---------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |

Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0

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Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
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Epoch 14/70
Epoch 15/70
Epoch 16/70
Epoch 17/70
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Epoch 41/70
Epoch 42/70
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Epoch 43/70
Epoch 44/70
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Epoch 63/70
Epoch 64/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7314800578123559
```

-----Fold 2-----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # | |
|---|---|---|--|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 | |
| lstm_2 (LSTM) | (None, 128) | 270848 | |
| dropout_1 (Dropout) | (None, 128) | 0 | |
| dense_1 (Dense) | (None, 1) | 129 | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |
| Epoch 1/70 1416/1416 [==================================== | | 1s 480us/step - loss | : 1.2048 - mae: |
| 1416/1416 [========== | | Os 68us/step - loss: | 0.6980 - mae: 0 |
| Epoch 3/70 1416/1416 [==================================== | :======] - | 0s 68us/step - loss: | 0.6154 - mae: 0 |
| Epoch 4/70 | 1 | | |
| 1416/1416 [========== | | 0s 75us/step - loss: | 0.5490 - mae: 0 |
| Epoch 5/70 | | 0 7 0 / 1 7 | 0 5000 |
| 1416/1416 [==================================== | ======] - | us /uus/step - loss: | 0.5238 - mae: 0 |
| 1416/1416 [========== | :======1 - | Os 68us/step - loss: | 0.4810 - mae: 0 |
| Epoch 7/70 | 1 | | 011010 |
| 1416/1416 [========== | | Os 67us/step - loss: | 0.5257 - mae: 0 |
| Epoch 8/70 | | | |
| 1416/1416 [============= | =======] - | 0s 69us/step - loss: | 0.4712 - mae: 0 |
| Epoch 9/70 1416/1416 [==================================== | 1 | Os 67us/sten loss. | 0 4447 mag. 0 |
| Epoch 10/70 | | 05 0/us/scep - 10ss: | 0.4447 - Illae: 0 |
| 1416/1416 [========= | | 0s 75us/step - loss: | 0.4839 - mae: 0 |
| Epoch 11/70 | • | - | |
| 1416/1416 [========== | | 0s 80us/step - loss: | 0.4584 - mae: 0 |
| Epoch 12/70 | | | |
| 1416/1416 [=========== |] - | 0s 78us/step - loss: | 0.4758 - mae: 0 |
| Epoch 13/70 1416/1416 [==================================== | 1 | 00.0000/0000 10000 | 0 4540 ================================= |
| Epoch 14/70 | J - | 05 02u5/5tep - 1055: | 0.4546 - Illae: 0 |
| 1416/1416 [========== | =======1 _ | 0s 79us/step - loss: | 0.4315 - mae: 0 |
| Epoch 15/70 | , | 111111111111111111111111111111111111111 | |
| 1416/1416 [========== | | 0s 76us/step - loss: | 0.3993 - mae: 0 |
| Epoch 16/70 | | | |
| 1416/1416 [=========== |] - | 0s 67us/step - loss: | 0.4135 - mae: 0 |
| Epoch 17/70 | 1 | 0.5 (7.15/5+0.5] 0.55 | 0 4040 |
| 1416/1416 [==================================== | = | us o/us/step - loss: | 0.4048 - mae: 0 |
| 1416/1416 [========== | ======================================= | Os 69us/step - loss: | 0.3840 - mae: 0 |
| Epoch 19/70 | 1 _ | 00 0000 - 1000. | 5.5510 - mac. 0 |
| 1416/1416 [========== | | 0s 72us/step - loss: | 0.4131 - mae: 0 |
| Epoch 20/70 | | | |
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Epoch 21/70
Epoch 22/70
Epoch 23/70
Epoch 24/70
Epoch 25/70
Epoch 26/70
Epoch 27/70
Epoch 28/70
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Epocn 49//U
Epoch 50/70
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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7998145916380829
```

-----Fold 3-----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|---------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |

dense_1 (Dense) (None, 1) 129

Total params: 2,141,377
Trainable params: 2,141,377

Non-trainable params: 0

| Epoch 1/70 | | | | |
|---|---|-----|--------------------|-------------------|
| 1416/1416 [=======] | - | 1s | 465us/step - loss | : 1.1559 - mae: |
| Epoch 2/70 | | | | |
| 1416/1416 [=========] | - | 0s | 67us/step - loss: | 0.6935 - mae: 0 |
| Epoch 3/70 | | | | |
| 1416/1416 [=======] | _ | 0s | 70us/step - loss: | 0.5591 - mae: 0 |
| Epoch 4/70 | | | | |
| 1416/1416 [=======] - | _ | 0s | 70us/step - loss: | 0.5701 - mae: 0 |
| Epoch 5/70 | | ^ | | 0 5005 |
| 1416/1416 [========] - | _ | US | 66us/step - loss: | 0.5225 - mae: 0 |
| Epoch 6/70 | | 0 | 67/ | 0 5102 |
| 1416/1416 [========] - | _ | US | 6/us/step - loss: | 0.5103 - mae: 0 |
| Epoch 7/70 1416/1416 [=======] - | | ٥٥ | 60ug/gton logg. | 0 5100 |
| Epoch 8/70 | _ | 05 | oous/step - 10ss: | 0.5100 - mae: 0 |
| 1416/1416 [=======] - | _ | ۸e | 7711g/g+en _ logg. | 0 4530 - mae: 0 |
| Epoch 9/70 | _ | 05 | //ds/scep - 10ss. | 0.4550 - mae. 0 |
| 1416/1416 [=======] - | _ | Λs | 7911s/sten - loss: | 0.4598 - mae: 0 |
| Epoch 10/70 | | 0.0 | /Jub/beep lobb. | 0.1330 mac. 0 |
| 1416/1416 [=======] - | _ | 0s | 75us/step - loss: | 0.4818 - mae: 0 |
| Epoch 11/70 | | | | |
| 1416/1416 [=======] | _ | 0s | 80us/step - loss: | 0.4233 - mae: 0 |
| Epoch 12/70 | | | - | |
| 1416/1416 [=======] - | _ | 0s | 80us/step - loss: | 0.4505 - mae: 0 |
| Epoch 13/70 | | | | |
| 1416/1416 [======] - | _ | 0s | 77us/step - loss: | 0.3817 - mae: 0 |
| Epoch 14/70 | | | | |
| 1416/1416 [========] | - | 0s | 69us/step - loss: | 0.4407 - mae: 0 |
| Epoch 15/70 | | 0 | 00 / 1 | 0 4100 |
| 1416/1416 [=======] - | _ | US | 82us/step - loss: | 0.4129 - mae: 0 |
| Epoch 16/70 1416/1416 [=======] - | | ٥٥ | 77ug/g+on logg. | 0 25/20 |
| Epoch 17/70 | _ | 05 | //us/step - 10ss: | 0.5542 - Mae: 0 |
| 1416/1416 [========] - | _ | Λs | 7511s/sten - loss: | 0.4394 - mae: 0 |
| Epoch 18/70 | | 0.0 | 734575605 10554 | |
| 1416/1416 [==================================== | _ | 0s | 71us/step - loss: | 0.3517 - mae: 0 |
| Epoch 19/70 | | | | |
| 1416/1416 [========] - | _ | 0s | 77us/step - loss: | 0.4258 - mae: 0 |
| Epoch 20/70 | | | | |
| 1416/1416 [=======] - | _ | 0s | 76us/step - loss: | 0.3909 - mae: 0 |
| Epoch 21/70 | | | | |
| 1416/1416 [=========] | - | 0s | 78us/step - loss: | 0.3882 - mae: 0 |
| Epoch 22/70 | | | | |
| 1416/1416 [========] - | _ | 0s | 81us/step - loss: | 0.3898 - mae: 0 |
| Epoch 23/70 | | 0 | 60/ | 0 2706 |
| 1416/1416 [=======] - | _ | US | oous/step - loss: | 0.3/86 - mae: 0 |
| Epoch 24/70 1416/1416 [=======] - | | 0 ~ | 67ug/g+on logg: | 0 4024 |
| Epoch 25/70 | _ | US | 0/us/step - 1088: | 0.4024 - Illae: 0 |
| 1416/1416 [=======] - | _ | 0,5 | 69us/sten - loss. | 0.3387 - mae: 0 |
| Epoch 26/70 | | . D | 1,45,500b - TODD. | itac. 0 |
| 1416/1416 [=======] - | _ | 0s | 84us/step - loss: | 0.3543 - mae: 0 |
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Epoch 27/70
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Epoch 55/70
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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6580811332904057
```

-----Fold 4-----

Model: "sequential 1"

| noder bequencial_i | | | | | | |
|---|--------|----------|----------|--------------|-----------------|---|
| Layer (type) | Output | Shape | | Param # | | |
| lstm_1 (LSTM) | (None, | 1, 400) | | 1870400 | | |
| lstm_2 (LSTM) | (None, | 128) | | 270848 | | |
| dropout_1 (Dropout) | (None, | 128) | | 0 | | |
| dense_1 (Dense) | (None, | 1) | | 129 | | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | | | | |
| Epoch 1/70 1416/1416 [==================================== | | =====] - | 1s 439us | /step - loss | : 1.1869 - mae: | |
| 1416/1416 [==================================== | | =====] - | 0s 72us/ | step - loss: | 0.6860 - mae: (| 0 |
| 1416/1416 [==================================== | -===== | =====] - | 0s 72us/ | step - loss: | 0.6262 - mae: | 0 |
| | | _ | / | | | _ |

```
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
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Epoch 34/70
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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6382319250724344
```

-----Fold 5-----

| Model: "sequential_1" | | | |
|---|------------------|-----------------|-----------------|
| Layer (type) | Output Shape | Param # | |
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 | |
| lstm_2 (LSTM) | (None, 128) | 270848 | |
| dropout_1 (Dropout) | (None, 128) | 0 | |
| dense_1 (Dense) | (None, 1) | 129 | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |
| Epoch 1/70 1416/1416 [==================================== |] - 1s 440 | Ous/step - loss | : 1.1782 - mae: |
| 1416/1416 [==================================== |] - 0s 78ı | ıs/step - loss: | 0.7184 - mae: 0 |
| 1416/1416 [==================================== | ======] – 0s 78ı | us/step - loss: | 0.5898 - mae: 0 |
| 1416/1416 [==================================== | ======] - 0s 77ı | us/step - loss: | 0.5147 - mae: 0 |
| 1416/1416 [==================================== | =====] - 0s 79ı | ıs/step - loss: | 0.5616 - mae: 0 |
| 1416/1416 [==================================== | =====] - 0s 79ı | ıs/step - loss: | 0.5038 - mae: 0 |
| 1416/1416 [==================================== |] - Os 82u | ıs/step - loss: | 0.5309 - mae: 0 |
| 1416/1416 [==================================== | ======] - 0s 80u | us/step - loss: | 0.4507 - mae: 0 |
| 1416/1416 [==================================== | =====] - 0s 82u | us/step - loss: | 0.4233 - mae: 0 |
| 1416/1416 [==================================== |] - 0s 80u | us/step - loss: | 0.4810 - mae: 0 |

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Epoch 12/70
Epoch 13/70
Epoch 14/70
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Epoch 40/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
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```
Epoch 69/70
Epoch 70/70
Kappa Score: 0.5746447995278048
Average kappa score value is: 0.6804505014682167
----SET 5----
-----Fold 1-----
Model: "sequential 1"
        Output Shape
Layer (type)
               Param #
______
               1870400
lstm_1 (LSTM)
        (None, 1, 400)
lstm 2 (LSTM)
        (None, 128)
               270848
dropout_1 (Dropout)
        (None, 128)
dense 1 (Dense)
        (None, 1)
               129
______
Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0
Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
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Epoch 10/70
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Epoch 13/70
Epoch 14/70
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Epoch 15/70

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Epoch 44/70
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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6933783710802677
```

-----Fold 2----

| Layer (type) | Output Shape | Param # | |
|--|---|-----------------------|------------------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 | |
| lstm_2 (LSTM) | (None, 128) | 270848 | |
| dropout_1 (Dropout) | (None, 128) | 0 | |
| dense_1 (Dense) | (None, 1) | 129 | |
| Total params: 2,141,377 | | | |
| Trainable params: 2,141,3 | 77 | | |
| Non-trainable params: 0 | | | |
| Epoch 1/70 | | | |
| 1444/1444 [========== |] - | ls 494us/step - loss | : 1.5998 - mae: |
| Epoch 2/70 | | | |
| 1444/1444 [========== | ======] - | Os 67us/step - loss: | 0.8876 - mae: 0 |
| Epoch 3/70 1444/1444 [================================== | 1 | 0.5 76.45/5+05 10.55 | 0.7534 2000 |
| Epoch 4/70 | | os /ous/step - loss: | 0.7534 - Mae: 0 |
| 1444/1444 [========== | ======================================= | 0s 75us/step - loss: | 0.6277 - mae: 0 |
| Epoch 5/70 | , | | |
| 1444/1444 [========== | ======] - | Os 77us/step - loss: | 0.6519 - mae: 0 |
| Epoch 6/70 | | | |
| 1444/1444 [========= |] - | 0s 80us/step - loss: | 0.6526 - mae: 0 |
| Epoch 7/70 1444/1444 [================================== | 1 | 0.5 7205/5+05 1055 | 0 6603 |
| Epoch 8/70 | | 05 /3u5/step - 1055: | 0.0003 - mae: 0 |
| 1444/1444 [========== | ======================================= | 0s 65us/step - loss: | 0.5968 - mae: 0 |
| Epoch 9/70 | , | | |
| 1444/1444 [========== | ======] - | Os 65us/step - loss: | 0.5959 - mae: 0 |
| Epoch 10/70 | | | |
| 1444/1444 [============ | ======] - | 0s 65us/step - loss: | 0.5823 - mae: 0 |
| Epoch 11/70 1444/1444 [================================== | ======1 _ : | Na 6711a/aten - losso | 0 5876 - mae: 0 |
| Epoch 12/70 | | 05 07d5/5cep - 1055. | 0.5070 - mae. 0 |
| 1444/1444 [========= | ======] - | Os 67us/step - loss: | 0.5680 - mae: 0 |
| Epoch 13/70 | | | |
| 1444/1444 [=========== | ======] - | Os 67us/step - loss: | 0.5169 - mae: 0 |
| Epoch 14/70 | | 0 - 67 / - | 0 |
| 1444/1444 [================================== | | us 6/us/step - loss: | 0.5230 - mae: 0 |
| 1444/1444 [========= | ======================================= | 0s 68us/step - loss: | 0.5789 - mae: 0 |
| Epoch 16/70 | 1 | | |
| 1444/1444 [========== | ======] - | Os 68us/step - loss: | 0.5045 - mae: 0 |
| Epoch 17/70 | | | |
| 1444/1444 [============= | ======] - | 0s 78us/step - loss: | 0.5049 - mae: 0 |
| Epoch 18/70 1444/1444 [================================== | ======================================= | Ns 6711s/sten = 10ss. | 0.5451 _ mage 0 |
| Epoch 19/70 | | 02 0102120cp - 1022. | O.DIDI - INGC. U |
| 1444/1444 [========== | ======] - | 0s 67us/step - loss: | 0.5160 - mae: 0 |
| Epoch 20/70 | | | |
| 1444/1444 [=========== | ======] - | Os 69us/step - loss: | 0.5133 - mae: 0 |
| Epoch 21/70 | | 00 6710 / 04 00 1 | 0 = 240 |
| 1444/1444 [================================== | | us o/us/step - loss: | U.3349 - Mae: 0 |

Epoch 22/70

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Epoch 25/70
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Epoch 50/70
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Epoch 51/70
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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6087588364245424
```

-----Fold 3-----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|---------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| | | |

Total params: 2,141,377
Trainable params: 2,141,377

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Epoch 1/70
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Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
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Epoch 8/70
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Epoch 58/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6934291772363426
```

-----Fold 4-----

Model: "sequential 1"

Epoch 6/70

| Layer (type) | Output Shape | Param # |
|---|------------------|---------------------------------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | |
| Epoch 1/70 1444/1444 [================================== | =====] - 1s 434 | us/step - loss: 1.6703 - mae: |
| 1444/1444 [================================== | ======] - Os 67t | us/step - loss: 0.8221 - mae: 0 |
| 1444/1444 [================================== |] - 0s 65v | ns/step - loss: 0.6967 - mae: 0 |
| _ | ======] - Os 68u | ns/step - loss: 0.6918 - mae: 0 |
| 1444/1444 [========== |] - Os 690 | us/step - loss: 0.6415 - mae: 0 |

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Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
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Epoch 35/70
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Epoch 36/70
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Epoch 63/70
Enoch 64/70
```

-----Fold 5-----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # |
|-------------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 | | |

Trainable params: 2,141,377
Non-trainable params: 0

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Epoch 3/70
Epoch 4/70
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Epoch 8/70
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Epoch 10/70
Epoch 11/70
Epoch 12/70
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Epoch 13/70
Epoch 14/70
Epoch 15/70
Epoch 16/70
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Epoch 40/70
Epoch 41/70
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Epoch 42/70
Epoch 43/70
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Epoch 68/70
Epoch 69/70
Epoch 70/70
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Kappa Score: 0.6964304383201741

Average kappa score value is: 0.6715231190681556

----SET 6----

-----Fold 1-----

Model: "sequential_1"

| Layer (type) | Output | Shape | Param # |
|-------------------------|--------|---------|---------|
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, | 128) | 270848 |
| dropout_1 (Dropout) | (None, | 128) | 0 |
| dense_1 (Dense) | (None, | 1) | 129 |
| Total params: 2,141,377 | | | |

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

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Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
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Epoch 8/70
Epoch 9/70
Epoch 10/70
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Epoch 16/70
Epoch 17/70
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Epoch 46/70
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Epoch 47/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6857393800475567
```

-----Fold 2----

Model: "sequential 1"

| Layer (type) | Output | Sha | ape | Param # |
|---|--------|------|------------|----------|
| ======================================= | ====== | ==== | ========== | ======== |
| lstm 1 (LSTM) | (None, | 1, | 400) | 1870400 |

| lstm_2 (LSTM) | (None, 128) | | | 270848 | | |
|---|---|------|-------------------|--------------------|--------------------|-----|
| dropout_1 (Dropout) | (None, 128) | | | 0 | | |
| dense_1 (Dense) | (None, 1) | | | 129 | | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | :=== | ==== | | | |
| Epoch 1/70 | | | | | | |
| 1440/1440 [=================================== | :=======] | _ | ls | 421us/step - loss | : 1.9563 - mae | • |
| 1440/1440 [========== | :====================================== | _ | 0s | 66us/step - loss: | 0.9236 - mae: | 0 |
| Epoch 3/70 | - | | | - | | |
| 1440/1440 [=========== |] | _ | 0s | 67us/step - loss: | 0.9131 - mae: | 0 |
| Epoch 4/70 | _ | | | | . = | |
| 1440/1440 [=================================== | -===== <u>]</u> | _ | 0s | 66us/step - loss: | 0./889 - mae: | 0 |
| 1440/1440 [========== | -====================================== | _ | 0s | 65us/step = loss: | 0.7651 - mae: | 0 |
| Epoch 6/70 | J | | 0.5 | 03db/bccp 10bb. | o o / o o i | |
| 1440/1440 [========== |] | _ | 0s | 66us/step - loss: | 0.7024 - mae: | 0 |
| Epoch 7/70 | | | | | | |
| 1440/1440 [========== | -======] | _ | 0s | 66us/step - loss: | 0.6710 - mae: | 0 |
| Epoch 8/70 | | | 0 | 67 | 0.6053 | ^ |
| 1440/1440 [=================================== | -===== <u>]</u> | _ | 0s | 6/us/step - loss: | 0.6853 - mae: | 0 |
| 1440/1440 [========== | -====================================== | _ | 0s | 7211s/sten = loss: | 0.7290 - mae: | 0 |
| Epoch 10/70 | J | | 05 | 7245/50CP - 1055. | 0 • 72 9 0 - mac • | 0 |
| 1440/1440 [========== | -======] | _ | 0s | 68us/step - loss: | 0.5984 - mae: | 0 |
| Epoch 11/70 | | | | | | |
| 1440/1440 [=========== | -======] | _ | 0s | 70us/step - loss: | 0.6319 - mae: | 0 |
| Epoch 12/70 | | | 0 - | 76/ | 0 (572 | 0 |
| 1440/1440 [=================================== | <u>J</u> | _ | US | /bus/step - loss: | 0.65/2 - mae: | 0 |
| 1440/1440 [========== | :====================================== | _ | 0s | 78us/step - loss: | 0.5260 - mae: | 0 |
| Epoch 14/70 | , | | | | | |
| 1440/1440 [========== | -======] | _ | 0s | 80us/step - loss: | 0.6318 - mae: | 0 |
| Epoch 15/70 | | | | | | |
| 1440/1440 [=========== | -====================================== | _ | 0s | 76us/step - loss: | 0.5630 - mae: | 0 |
| Epoch 16/70 1440/1440 [=================================== | 1 | | ٥٥ | 72ug/g+on logg. | 0 6010 mag. | 0 |
| Epoch 17/70 | J | _ | 05 | /2us/step - 10ss: | 0.0010 - mae: | U |
| 1440/1440 [========== | -====================================== | _ | 0s | 73us/step - loss: | 0.5768 - mae: | 0 |
| Epoch 18/70 | - | | | - | | |
| 1440/1440 [=========== |] | _ | 0s | 70us/step - loss: | 0.5828 - mae: | 0 |
| Epoch 19/70 | _ | | | | | |
| 1440/1440 [=================================== | -====================================== | _ | 0s | 70us/step - loss: | 0.4947 - mae: | 0 |
| Epoch 20/70 1440/1440 [=================================== | 1 | | Λc | 6911g/gten _ logg. | 0 5894 - mae: | Ο |
| Epoch 21/70 | | | 05 | 07d3/5cep - 1035. | 0.5074 - mae. | U |
| 1440/1440 [=========== | -====================================== | _ | 0s | 68us/step - loss: | 0.5526 - mae: | 0 |
| Epoch 22/70 | - | | | - | | |
| 1440/1440 [========== |] | _ | 0s | 68us/step - loss: | 0.5793 - mae: | 0 |
| Epoch 23/70 | _ | | 0 | 67 | 0 5006 | ^ |
| 1440/1440 [=================================== | -======] | _ | US | o/us/step - loss: | U.5226 - mae: | 0 |
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Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6057003078945127
```

-----Fold 3-----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|-------------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 | | |

Trainable params: 2,141,377
Non-trainable params: 0

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Epoch 1/70
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Epoch 2/70
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Epoch 60/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7090864455150827
```

-----Fold 4-----

Model: "sequential 1"

Epoch 4/70

Epoch 5/70

Epoch 6/70

Epoch 7/70

Epoch 8/70

| Layer (type) | Output | Shape | Param # | |
|---|--------|---------|---------|--|
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 | |
| lstm_2 (LSTM) | (None, | 128) | 270848 | |
| dropout_1 (Dropout) | (None, | 128) | 0 | |
| dense_1 (Dense) | (None, | 1) | 129 | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | | |
| Epoch 1/70 1440/1440 [=================================== | | - | - | |

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----Fold 5----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # |
|-------------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| motol maramas 2 1/1 277 | | |

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70

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Epoch 44/70
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Epoch 63/70
Epoch 64/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.6580027359781122
Average kappa score value is: 0.6642078520250413
```

-----Fold 1-----

Model: "sequential 1"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, | 128) | 270848 |
| dropout_1 (Dropout) | (None, | 128) | 0 |
| dense_1 (Dense) | (None, | 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70 Epoch 18/70 Epoch 19/70

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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.8067079692955195
```

-----Fold 2----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|---------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |

dropout 1 (Dropout) (None, 128)

AES.ipynb - Colaboratory ~_~~~__ (*>*__, dense 1 (Dense) (None, 1) 129 ______ Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 6/70 Epoch 8/70 Epoch 9/70 Epoch 11/70 Epoch 15/70

```
Epoch 5/70
Epoch 7/70
Epoch 10/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
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Epoch 23/70
Epoch 24/70
Epoch 25/70
```

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Epocn 26//U
Epoch 27/70
Epoch 28/70
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Epoch 47/70
Epoch 48/70
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Epoch 50/70
Epoch 51/70
Epoch 52/70
Epoch 53/70
Epoch 54/70
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Epoch 55/70
Epoch 56/70
Epoch 57/70
Epoch 58/70
Epoch 59/70
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Epoch 61/70
Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7508025238508402
```

-----Fold 3-----

Model: "sequential 1"

| | Shape | Param # |
|--------|---------|--|
| (None, | 1, 400) | 1870400 |
| (None, | 128) | 270848 |
| (None, | 128) | 0 |
| (None, | 1) | 129 |
| | | |
| | | |
| | (None, | (None, 1, 400) (None, 128) (None, 1) |

```
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
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Epoch 25/70
Epoch 26/70
Epoch 27/70
Epoch 28/70
Epoch 29/70
Epoch 30/70
Epoch 31/70
Epoch 32/70
1255/1255 [----
      ne 6711e/e+an
        1000 11 0575
```

```
1200/1200 [-----
      -- ] - vs v/us/scep - 10ss: 11.05/5 - mae:
Epoch 33/70
Epoch 34/70
Epoch 35/70
Epoch 36/70
Epoch 37/70
Epoch 38/70
Epoch 39/70
Epoch 40/70
Epoch 41/70
Epoch 42/70
Epoch 43/70
Epoch 44/70
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Epoch 54/70
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Epoch 56/70
Epoch 57/70
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Epoch 60/70
Epoch 61/70
```

```
Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.715215633554471
```

-----Fold 4-----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|--------------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| motol moreons, 2 1/1 277 | | |

Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0

```
Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
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```
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
Epoch 16/70
Epoch 17/70
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Epoch 35/70
Epoch 36/70
Epoch 37/70
Epoch 38/70
Epoch 39/70
```

```
TPOOT 37/10
Epoch 40/70
Epoch 41/70
Epoch 42/70
Epoch 43/70
Epoch 44/70
Epoch 45/70
Epoch 46/70
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Epoch 48/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
```

```
AES.ipynb - Colaboratory
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7856609525978588
-----Fold 5----
Model: "sequential 1"
Layer (type)
        Output Shape
               Param #
_____
        (None, 1, 400)
               1870400
lstm_1 (LSTM)
lstm 2 (LSTM)
        (None, 128)
               270848
dropout 1 (Dropout)
        (None, 128)
dense 1 (Dense)
        (None, 1)
                129
______
Total params: 2,141,377
Trainable params: 2,141,377
Non-trainable params: 0
Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
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Epoch 14/70

Epoch 15/70

Epoch 16/70

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Epoch 17/70
Epoch 18/70
Epoch 19/70
Epoch 20/70
Epoch 21/70
Epoch 22/70
Epoch 23/70
Epoch 24/70
Epoch 25/70
Epoch 26/70
Epoch 27/70
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Epoch 39/70
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Epoch 41/70
Epoch 42/70
Epoch 43/70
Epoch 44/70
Epoch 45/70
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Epoch 46/70
Epoch 47/70
Epoch 48/70
Epoch 49/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.7610392764301905
Average kappa score value is: 0.763885271145776
----SET 8-----
```

-----Fold 1-----

Model: "sequential_1"

| Layer (type) | Output Shape | Param # |
|---|--|--------------------------------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | |
| Epoch 1/70 578/578 [==================================== | ====================================== | ep - loss: 1187.5452 - mae: 3 |
| Epoch 2/70 | | tep - loss: 717.5685 - mae: 2 |
| Epoch 3/70 | | step - loss: 633.2339 - mae: 2 |
| Epoch 4/70 | - | _ |
| Epoch 5/70 | | tep - loss: 591.4566 - mae: 2 |
| 578/578 [==================================== | ======] - 0s 88us/s | tep - loss: 570.6636 - mae: 2 |
| _ | ======] - 0s 85us/s | tep - loss: 540.7582 - mae: 2 |
| 578/578 [=========== |] - 0s 74us/s | tep - loss: 517.6905 - mae: 2 |
| |] - 0s 74us/s | tep - loss: 498.4713 - mae: 2 |
| Epoch 9/70 578/578 [==================================== |] - 0s 74us/s | step - loss: 474.2727 - mae: 2 |
| Epoch 10/70 | | step - loss: 458.7611 - mae: 2 |
| Epoch 11/70 | | |
| Epoch 12/70 | - | tep - loss: 436.6621 - mae: 2 |
| 578/578 [=========== Epoch 13/70 | =======] - 0s 75us/s | step - loss: 413.0862 - mae: 1 |
| 578/578 [==================================== |] - 0s 77us/s | tep - loss: 399.9571 - mae: 1 |
| - |] - 0s 75us/s | tep - loss: 384.3374 - mae: 1 |
| 578/578 [=========== |] - 0s 73us/s | step - loss: 363.6440 - mae: 1 |
| Epoch 16/70 578/578 [==================================== |] - 0s 74us/s | step - loss: 345.2199 - mae: 1 |
| Epoch 17/70 578/578 [==================================== | 1 - 0s 78us/s | tep - loss: 330.1179 - mae: 1 |
| Epoch 18/70 | | step - loss: 315.9423 - mae: 1 |
| Epoch 19/70 | | |
| Epoch 20/70 | | step - loss: 300.3896 - mae: 1 |
| 578/578 [========== Epoch 21/70 |] - Os 72us/s | tep - loss: 285.5897 - mae: 1 |

```
Epoch 22/70
Epoch 23/70
Epoch 24/70
Epoch 25/70
Epoch 26/70
Epoch 27/70
Epoch 28/70
Epoch 29/70
578/578 [==============] - Os 81us/step - loss: 176.5163 - mae: 1
Epoch 30/70
578/578 [============== ] - 0s 83us/step - loss: 163.8100 - mae: 1
Epoch 31/70
Epoch 32/70
Epoch 33/70
Epoch 34/70
Epoch 35/70
Epoch 36/70
Epoch 37/70
Epoch 38/70
Epoch 39/70
Epoch 40/70
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Epoch 42/70
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Epoch 50/70
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Epoch 51/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.0
```

-----Fold 2----

Model: "sequential 1"

| Layer (type) | Output Shape | Param # |
|---------------------|----------------|---------|
| lstm_1 (LSTM) | (None, 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, 128) | 270848 |
| dropout_1 (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 1) | 129 |

Total narams. 2 141 377

Trainable params: 2,141,377
Non-trainable params: 0

```
Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
578/578 [============== ] - 0s 73us/step - loss: 483.7300 - mae: 2
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
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Epoch 27/70
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Epoch 28/70
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Epoch 56/70
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Epoch 57/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.0
```

-----Fold 3-----

Model: "sequential 1"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| ====================================== | (None, | 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, | 128) | 270848 |
| dropout_1 (Dropout) | (None, | 128) | 0 |
| dense_1 (Dense) | (None, | 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |

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Epoch 6/70
Epoch 7/70
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Epoch 35/70
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Epoch 62/70
Epoch 63/70
```

```
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.0
```

-----Fold 4-----

| Layer (type) | Output | Shape | Param # | |
|---|--------|---------|-----------------|-------------|
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 | |
| lstm_2 (LSTM) | (None, | 128) | 270848 | |
| dropout_1 (Dropout) | (None, | 128) | 0 | |
| dense_1 (Dense) | (None, | 1) | 129 | |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | ===== | | ======= | |
| Epoch 1/70 | | 1 | | 4502 mag |
| 579/579 [==================================== | | ==== | ep - 105S: 1204 | .4582 - Mae |

```
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Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
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Epoch 11/70
Epoch 12/70
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Epoch 13/70
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Epoch 31/70
Epoch 32/70
Epoch 33/70
Epoch 34/70
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тросп 41//и
Epoch 42/70
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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
```

-----Fold 5-----

Model: "sequential_1"

| T (1) | 011 | G1 | D = // |
|---|--------|---------|---------|
| Layer (type) | Output | Snape | Param # |
| lstm_1 (LSTM) | (None, | 1, 400) | 1870400 |
| lstm_2 (LSTM) | (None, | 128) | 270848 |
| dropout_1 (Dropout) | (None, | 128) | 0 |
| dense_1 (Dense) | (None, | 1) | 129 |
| Total params: 2,141,377 Trainable params: 2,141,377 Non-trainable params: 0 | | | |
| | | | |

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70 Epoch 18/70

```
Epoch 19/70
Epoch 20/70
Epoch 21/70
Epoch 22/70
Epoch 23/70
Epoch 24/70
579/579 [============== ] - 0s 73us/step - loss: 210.1026 - mae: 1
Epoch 25/70
Epoch 26/70
Epoch 27/70
Epoch 28/70
Epoch 29/70
Epoch 30/70
Epoch 31/70
Epoch 32/70
Epoch 33/70
Epoch 34/70
Epoch 35/70
Epoch 36/70
Epoch 37/70
Epoch 38/70
Epoch 39/70
Epoch 40/70
Epoch 41/70
Epoch 42/70
Epoch 43/70
Epoch 44/70
Epoch 45/70
Epoch 46/70
Epoch 47/70
```

```
J171717 [
       00 /200/DCCP TODD: 00:00=0
Epoch 48/70
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Epoch 50/70
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Epoch 54/70
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Epoch 56/70
Epoch 57/70
Epoch 58/70
Epoch 59/70
Epoch 60/70
Epoch 61/70
Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
Kappa Score: 0.0
Average kappa score value is: 0.0
```

Below we will run for whole dataset using BERT but using CNN, which didnt performed so well.

```
# For whole dataset
import time
import torch
import transformers as ppb
import warnings
warnings.filterwarnings('ignore')
cv = KFold(n splits=5, shuffle=True)
\# X = set8
# y = set8['domain1_score']
X= data
y = data['domain1 score']
cv data = cv.split(X)
results = []
prediction list = []
fold count =1
# use_cuda = True
# if use cuda and torch.cuda.is available():
# torch.cuda()
# Hyperpaprameters for LSTM
```

```
Hidden dim1=300
Hidden_dim2=100
return sequences = True
dropout=0.5
recurrent dropout=0.4
input size=768
activation='relu'
bidirectional = True
batch size = 64
epoch = 100
#####
cuda = torch.device('cuda')
# For DistilBERT:
model class, tokenizer class, pretrained weights = (ppb.DistilBertModel, ppb.DistilF
## Want BERT instead of distilBERT? Uncomment the following line:
##model class, tokenizer_class, pretrained_weights = (ppb.BertModel, ppb.BertTokeniz
# Load pretrained model/tokenizer
tokenizer = tokenizer class.from pretrained(pretrained weights)
model = model class.from pretrained(pretrained weights)
with torch.cuda.device(cuda):
  for traincy, testcy in cy data:
    torch.cuda.empty cache()
    print("\n----Fold {}----\n".format(fold count))
    # get the train and test from the dataset.
    X train, X test, y train, y test = X.iloc[traincv], X.iloc[testcv], y.iloc[trair
    train_essays = X_train['essay']
    #print("y train",y train)
    test essays = X test['essay']
    # model = model.cuda()
    #y train = torch.tensor(y train,dtype=torch.long)
    sentences = []
    tokenize sentences = []
    train bert embeddings = []
    #bert embedding = BertEmbedding()
    # for essay in train essays:
      # get all the sentences from the essay
        sentences += essay to sentences(essay, remove stopwords = True)
    # sentences = pd.Series(sentences)
    # print(train essays)
    tokenized train = train essays.apply((lambda x: tokenizer.encode(x, add special
    tokenized test = test essays.apply((lambda x: tokenizer.encode(x, add special to
    ## train
    \max len = 0
    for i in tokenized train.values:
      if len(i) > max len:
        \max len = len(i)
    padded train = np.array([i + [0]*(max len-len(i)) for i in tokenized train.value
    attention mask train = np.where(padded train != 0, 1, 0)
```

```
train input ids = torch.tensor(padded train)
train attention mask = torch.tensor(attention mask train)
with torch.no grad():
  last hidden states train = model(train input ids, attention mask=train attenti
train_features = last_hidden_states_train[0][:,0,:].numpy()
## test
\max len = 0
for i in tokenized test.values:
  if len(i) > max len:
    \max len = len(i)
padded_test = np.array([i + [0]*(max len-len(i)) for i in tokenized test.values]
attention mask test = np.where(padded test != 0, 1, 0)
test input ids = torch.tensor(padded test)
test attention mask = torch.tensor(attention mask test)
with torch.no_grad():
  last hidden states test = model(test input ids, attention mask=test attention
test features = last hidden_states_test[0][:,0,:].numpy()
train x, train y = train features.shape
test x, test y = test features.shape
trainDataVectors = np.reshape(train features,(train x,1,train y))
testDataVectors = np.reshape(test_features,(test_x,1,test_y))
# print(trainDataVectors)
# print(testDataVectors)
# trainDataVectors = np.reshape(train features,(train x,train y,1))
# testDataVectors = np.reshape(test features,(test x,test y,1))
trainDataVectors = np.reshape(train features,(train x,1, train y))
testDataVectors = np.reshape(test features,(test x,1, test y))
# lstm model = get model CNN(bidirectional=False, output dims = 1)
lstm model = get model(Hidden dim1=Hidden dim1, Hidden dim2=Hidden dim2, return
                        dropout=dropout, recurrent dropout=recurrent dropout, ir
                        activation=activation, bidirectional=bidirectional)
history = lstm model.fit(trainDataVectors, y train, batch size=batch size, epoch
plot accuracy curve(history)
y pred = lstm model.predict(testDataVectors)
y pred = np.around(y pred)
#y pred.dropna()
np.nan to_num(y_pred)
# evaluate the model
print(y pred)
result = cohen kappa score(y test.values,y pred,weights='quadratic')
print("Kappa Score: {}".format(result))
results.append(result)
fold count +=1
```

```
import tensorflow as tf
    tf.keras.backend.clear_session()
print("Average kappa score value is : {}".format(np.mean(np.asarray(results))))
    # print(features.shape)
```

 \Box

Downloading: 100% 232k/232k [00:00<00:00, 637kB/s]

Downloading: 100% 546/546 [00:10<00:00, 54.6B/s]

Downloading: 100% 268M/268M [00:09<00:00, 29.1MB/s]

-----Fold 1-----

Model: "sequential_1"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_1 (Bidirection | (None, | 1, 600) | 2565600 |
| bidirectional_2 (Bidirection | (None, | 200) | 560800 |
| dropout_1 (Dropout) | (None, | 200) | 0 |
| dense_1 (Dense) | (None, | 1) | 201 |

Total params: 3,126,601
Trainable params: 3,126,601
Non-trainable params: 0

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Epoch 3/100
Epoch 4/100
Epoch 5/100
Epoch 6/100
Epoch 7/100
Epoch 8/100
Epoch 9/100
Epoch 10/100
Epoch 11/100
Epoch 12/100
Epoch 13/100
Epoch 14/100
Epoch 15/100
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| | AES.ipyno - Colaborator | | | | | |
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| Epoch 16/100 | l 1 = | | JJ045/500P | TODD. | 10.0200 | 1110 |
| _ | [======] - 4 | lc | 35611g/g+op | 1000 | 9 9/96 | mao |
| Epoch 17/100 | [] | 10 | 550d5/5cep - | 1055. | J.J.J.J. – | mae |
| - | [=======] - 4 | ls | 358us/step - | loss: | 9.9237 - | mae |
| Epoch 18/100 | | | ээсин неер | 1000. | J. J. Z. J. T. | mac |
| - | [=======] - 4 | ls | 359us/step - | loss: | 9.3109 - | mae |
| Epoch 19/100 | | | | | | |
| - | [======] - 4 | ls | 358us/step - | loss: | 9.2093 - | mae |
| Epoch 20/100 | - | | _ | | | |
| 10380/10380 | [=======] - 4 | ls | 358us/step - | loss: | 8.8354 - | mae |
| Epoch 21/100 | | | | | | |
| | [======] - 4 | ls | 360us/step - | loss: | 8.9773 - | mae |
| Epoch 22/100 | | | | | | |
| | [======] - 4 | ls | 357us/step - | loss: | 8.6178 - | mae |
| Epoch 23/100 | | | 0=0 / . | - | . = . = . | |
| | [======] - 4 | ŀS | 359us/step - | loss: | 8.7058 - | mae |
| Epoch 24/100 | [======] - 4 | 1 a | 25611g/g+on | 1000 | 7 7100 | m 2 0 |
| Epoch 25/100 | [] - 4 | ł S | 330us/step - | 1055: | /./100 - | Illae |
| - | [======] - 4 | ls | 35911s/sten - | 1055: | 8.2809 - | mae |
| Epoch 26/100 | [| | 337db/ bccp = | 1055. | 0.2007 | mac |
| - | [=======] - 4 | ls | 356us/step - | loss: | 8.0956 - | mae |
| Epoch 27/100 | | | | | | |
| 10380/10380 | [=======] - 4 | ls | 357us/step - | loss: | 7.5806 - | mae |
| Epoch 28/100 | | | | | | |
| 10380/10380 | [=======] - 4 | ls | 357us/step - | loss: | 7.5882 - | mae |
| Epoch 29/100 | | | | | | |
| | [=======] - 4 | ls | 356us/step - | loss: | 7.2521 - | mae |
| Epoch 30/100 | | | | _ | | |
| | [=======] - 4 | ł S | 360us/step - | loss: | 7.1751 - | mae |
| Epoch 31/100 | r1 | 1 ~ | 257 | 1 | C 0505 | |
| Epoch 32/100 | [=======] - 4 | ł S | 35/us/step - | TOSS: | 0.8383 - | Illae |
| - | [======] - 4 | ls | 360119/sten - | 1055: | 7.0416 - | mae |
| Epoch 33/100 | | | эооцы, всер | 1000. | 7.0110 | mac |
| - | [======] - 4 | ls | 358us/step - | loss: | 6.8033 - | mae |
| Epoch 34/100 | | | | | | |
| 10380/10380 | [=======] - 4 | ls | 359us/step - | loss: | 6.7174 - | mae |
| Epoch 35/100 | | | | | | |
| | [=======] - 4 | ls | 360us/step - | loss: | 6.5165 - | mae |
| Epoch 36/100 | | | | _ | | |
| · · | [=======] - 4 | ls | 361us/step - | loss: | 6.3266 - | mae |
| Epoch 37/100 | | 1 | 250/ | 1 | 6 2617 | |
| Epoch 38/100 | [======] - 4 | ł S | 358us/step - | TOSS: | 0.201/ - | mae |
| - | [======] - 4 | lc | 36011g/gten - | 1000 | 6 2561 - | mae |
| Epoch 39/100 | [] | 10 | Jooda/acep - | 1055. | 0.2301 - | mae |
| - | [======] - 4 | ls | 362us/step - | loss: | 6.2620 - | mae |
| Epoch 40/100 | | | | | | |
| - | [=======] - 4 | ls | 359us/step - | loss: | 5.8031 - | mae |
| Epoch 41/100 | • | | - | | | |
| 10380/10380 | [=======] - 4 | ls | 358us/step - | loss: | 6.1580 - | mae |
| Epoch 42/100 | | | | | | |
| | [======] - 4 | ls | 360us/step - | loss: | 5.4604 - | mae |
| Epoch 43/100 | _ | | | - | | |
| | [======] - 4 | ł S | 359us/step - | Loss: | 5.7241 - | mae |
| Epoch 44/100 | | | 250 / 1 | 7 | F 6604 | |
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Model loss



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Kappa Score: 0.9239790570710182

-----Fold 2-----

Model: "sequential 1"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| bidirectional_1 (Bidirection | (None, | 1, 600) | 2565600 |
| bidirectional_2 (Bidirection | (None, | 200) | 560800 |
| dropout_1 (Dropout) | (None, | 200) | 0 |
| dense_1 (Dense) | (None, | 1) | 201 |
| Total params: 3,126,601 Trainable params: 3,126,601 Non-trainable params: 0 | | | |

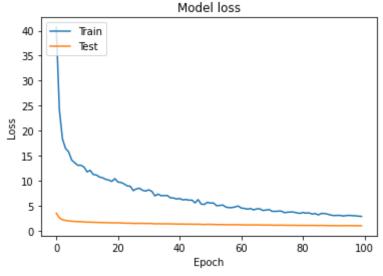
Non-trainable params: 0

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Kappa Score: 0.9450567379796316
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-----Fold 3-----

Model: "sequential 1"

Enoch 3/100

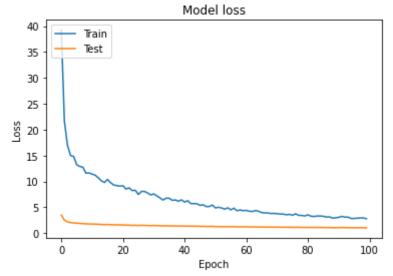
| <u> </u> | | | | |
|---|--------|----------------|-----------------|-----------------|
| Layer (type) | Output | Shape | Param # | |
| bidirectional_1 (Bidirection | (None, | 1, 600) | 2565600 | |
| bidirectional_2 (Bidirection | (None, | 200) | 560800 | |
| dropout_1 (Dropout) | (None, | 200) | 0 | |
| dense_1 (Dense) | (None, | 1) | 201 | |
| Total params: 3,126,601 Trainable params: 3,126,601 Non-trainable params: 0 | | | | |
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Kappa Score: 0.9256860865252433
```

Model: "sequential 1"

-----Fold 4-----

| Layer (type) | Output Shape | Param # |
|------------------------------|----------------|---------|
| | | |
| bidirectional_1 (Bidirection | (None, 1, 600) | 2565600 |
| bidirectional_2 (Bidirection | (None, 200) | 560800 |

dropout_1 (Dropout) (None, 200) 0

dense_1 (Dense) (None, 1) 201

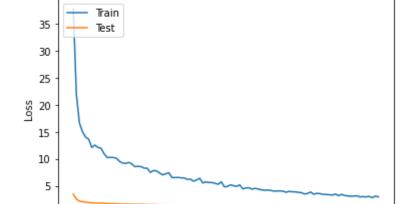
Total params: 3,126,601 Trainable params: 3,126,601 Non-trainable params: 0

Epoch 1/100 Epoch 2/100 Epoch 3/100 Epoch 4/100 Epoch 5/100 Epoch 6/100 Epoch 7/100 Epoch 8/100 Epoch 9/100 Epoch 10/100 Epoch 11/100 Epoch 12/100 Epoch 13/100 Epoch 14/100 Epoch 15/100 Epoch 16/100 Epoch 17/100 Epoch 18/100 Epoch 19/100 Epoch 20/100 Epoch 21/100 Epoch 22/100 Epoch 23/100 Epoch 24/100 Epoch 25/100

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Epoch

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Model loss

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Kappa Score: 0.9236147722479966

-----Fold 5-----

Model: "sequential_1"

| Layer (type) | _ | Shape | | | Param | | | | |
|---|---------------------|---------|-----|-------|--------------|---|-------|---------|---------|
| bidirectional_1 (Bidirection | | | | | 25656 | | | | |
| bidirectional_2 (Bidirection | (None, | 200) | | | 56080 | 0 | | | |
| dropout_1 (Dropout) | (None, | 200) | | | 0 | | | | |
| dense_1 (Dense) | (None, | , | | | 201 | | | | |
| Total params: 3,126,601 Trainable params: 3,126,601 Non-trainable params: 0 | | | | | | | | | |
| Epoch 1/100 10381/10381 [======= | ====== | ======] | _ | 5s | 502us/step | _ | loss: | 38.7174 | - ma |
| Epoch 2/100 10381/10381 [==================================== | ====== | ======] | _ | 4s | 363us/step | - | loss: | 21.7106 | - ma |
| Epoch 3/100 10381/10381 [==================================== | ===== | =====] | - | 4s | 363us/step | - | loss: | 17.3556 | - ma |
| Epoch 4/100 10381/10381 [==================================== | :===== | =====] | - | 4s | 363us/step | - | loss: | 14.7154 | - ma |
| 10381/10381 [==================================== | ====== | =====] | - | 4s | 362us/step | - | loss: | 14.1815 | - ma |
| 10381/10381 [============ Epoch 7/100 | ===== | =====] | - | 4s | 363us/step | - | loss: | 13.6579 | - ma |
| 10381/10381 [============ Epoch 8/100 | :===== | =====] | - | 4s | 361us/step | - | loss: | 13.3326 | - ma |
| 10381/10381 [============ Epoch 9/100 | :===== | =====] | - | 4s | 360us/step | - | loss: | 13.0119 | - ma |
| 10381/10381 [=========== Epoch 10/100 | ====== | =====] | - | 4s | 363us/step | - | loss: | 12.1769 | - ma |
| 10381/10381 [============ Epoch 11/100 | ===== | =====] | - | 4s | 363us/step | - | loss: | 12.2298 | - ma |
| 10381/10381 [=========== Epoch 12/100 | ===== | =====] | - | 4s | 364us/step | - | loss: | 11.5545 | - ma |
| 10381/10381 [============ Epoch 13/100 | :===== | ======] | - | 4s | 361us/step | - | loss: | 11.1863 | - ma |
| 10381/10381 [============ Epoch 14/100 | ====== | ======] | - | 4s | 362us/step | - | loss: | 10.9262 | - ma |
| 10381/10381 [=========== Epoch 15/100 | ====== | ======] | - | 4s | 359us/step | - | loss: | 10.3753 | - ma |
| 10381/10381 [=========== Epoch 16/100 | ===== | ======] | - | 4s | 377us/step | - | loss: | 10.4716 | - ma |
| 10381/10381 [=========== Epoch 17/100 | | | | | _ | | | | |
| 10381/10381 [=========== Epoch 18/100 | | | | | _ | | | | |
| 10381/10381 [============ Epoch 19/100 | ===== | ======] | - | 4s | 368us/step | - | loss: | 9.3774 | - mae |
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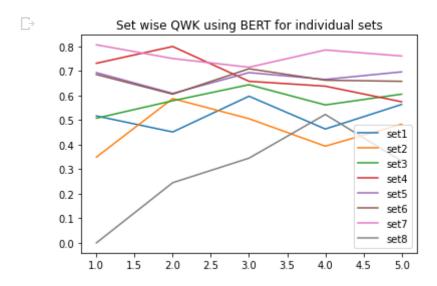
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|---------------------------------------|------------------|-------|-----|-------------|---|----------------|-------------|--------|-----|
| 10381/10381 | [========] | _ | 4s | 361us/step | _ | loss: | 3.9551 | – ma | ae |
| Epoch 78/100 | ı | | | 00100,000p | | _022 | 0 0 0 0 0 0 | | |
| _ | [========] | _ | 4s | 360us/step | _ | loss: | 3.4323 | – ma | ae |
| Epoch 79/100 | | | | | | | | | |
| 10381/10381 | [========] | _ | 4s | 360us/step | _ | loss: | 3.8070 | – ma | ae |
| Epoch 80/100 | | | | | | | | | |
| | [=======] | _ | 4s | 363us/step | - | loss: | 3.3098 | – ma | ae |
| Epoch 81/100 | | | | | | | | | |
| | [======] | _ | 4s | 363us/step | - | loss: | 3.6268 | – ma | ae |
| Epoch 82/100 | | | 4 | 250 / | | 7 | 2 4257 | | |
| | [======] | _ | 4 S | 358us/step | _ | loss: | 3.435/ | – ma | ae |
| Epoch 83/100 | [========] | | 1 a | 36/11c/c+on | | 1000 | 2 251/ | 770 5 | 20 |
| Epoch 84/100 | [] | _ | 45 | 304us/scep | _ | TOSS: | 2.3314 | - 1116 | ae |
| - | [========] | _ | 4 9 | 36411s/sten | _ | 1055: | 3.4483 | _ ma | 9.0 |
| Epoch 85/100 | ı ı | | 10 | оотав, всер | | TODD. | 3.1103 | 1110 | |
| _ | [=======] | _ | 4s | 363us/step | _ | loss: | 3.3134 | – ma | ae |
| Epoch 86/100 | - | | | | | | | | |
| _ | [========] | _ | 4s | 362us/step | _ | loss: | 3.4486 | – ma | ae |
| Epoch 87/100 | | | | | | | | | |
| 10381/10381 | [========] | _ | 4s | 361us/step | _ | loss: | 3.2741 | – ma | ae |
| Epoch 88/100 | | | | | | | | | |
| · · · · · · · · · · · · · · · · · · · | [=======] | _ | 4s | 361us/step | - | loss: | 3.2797 | – ma | ae |
| Epoch 89/100 | _ | | | 0.50 | | - | | | |
| · · · · · · · · · · · · · · · · · · · | [======] | _ | 4 S | 362us/step | _ | loss: | 3.0221 | – ma | ae |
| Epoch 90/100 | r1 | | 1 ~ | 260119/9405 | | 1000 | 2 0622 | 700 | |
| Epoch 91/100 | [======] | _ | 45 | 360us/step | _ | TOSS: | 3.0032 | - IIIc | ае |
| _ | [=========] | _ | 4 9 | 362115/sten | _ | 1055: | 3.2027 | _ ma | 9.0 |
| Epoch 92/100 | L J | | 10 | 0024575005 | | 1000 | 0.2027 | 1110 | |
| _ | [========] | _ | 4s | 361us/step | _ | loss: | 3.2664 | – ma | ae |
| Epoch 93/100 | - | | | _ | | | | | |
| 10381/10381 | [========] | _ | 4s | 360us/step | _ | loss: | 3.1917 | – ma | ae |
| Epoch 94/100 | | | | | | | | | |
| · · · · · · · · · · · · · · · · · · · | [=======] | _ | 4s | 360us/step | _ | loss: | 3.0492 | – ma | ae |
| Epoch 95/100 | | | | | | | | | |
| · · · · · · · · · · · · · · · · · · · | [======] | _ | 4s | 366us/step | - | loss: | 2.9440 | – ma | ae |
| Epoch 96/100 | | | 1 | 202/ | | 1 | 2 0216 | | |
| Epoch 97/100 | [=======] | _ | 45 | 38Zus/step | _ | TOSS: | 3.0210 | – ma | ае |
| - | [========] | _ | 1 c | 36311g/g+en | _ | 1000 | 3 0329 | _ m= | 20 |
| Epoch 98/100 | - | | 10 | Jojus/ scep | | 1055. | 3.0327 | - 1110 | 10 |
| _ | [=======] | _ | 4s | 360us/step | _ | loss: | 3.2236 | – ma | ae |
| Epoch 99/100 | | | | | | 3 2 2 3 | | | _ |
| _ | [=======] | _ | 4s | 359us/step | _ | loss: | 2.8860 | – ma | ae |
| Epoch 100/100 | | | | - | | | | | |
| 10381/10381 | [=======] | _ | 4s | 364us/step | _ | loss: | 2.8015 | – ma | ae |
| | Model loss | | | | | | | | |





```
x = [1,2,3,4,5]
ax.plot(x, set1 , label='set1')
ax.plot(x, set2, label='set2')
ax.plot(x, set3, label='set3')
ax.plot(x, set4, label='set4')
ax.plot(x, set5, label='set5')
ax.plot(x, set6, label='set6')
ax.plot(x, set7, label='set7')
ax.plot(x, set8, label='set8')
plt.title('Set wise QWK using BERT for individual sets')
ax.legend()
plt.show()
```



Building word2vec model method to render the text and convert to word2vec feature vector.

```
def build word2vec(train sentences, num workers, num features, min word count, conte
                     downsampling):
   model = Word2Vec(workers=num workers, size=num features, min count=min word cour
                     sample=downsampling)
   # saving the word2vec model
    # model.wv.save word2vec format('word2vec '+ str(fold count) +'.bin', binary=Tru
    cores = multiprocessing.cpu count()
    print("\n {} cores using".format(cores))
    start time = time.time()
   model.build vocab(train sentences, progress per=10000)
    print('Time to build vocab using word2vec: {} sec'.format(time.time() - start ti
    start time = time.time()
   model.train(train sentences, total examples=model.corpus count, epochs=epochs, r
    print('Time to train the word2vec model: {} mins'.format(time.time() - start tim
   model.init sims(replace=True)
    sorted dic = sorted(top10.items(), key=lambda k: k[1], reverse=True)
    return model, sorted dic
```

Below method will run on individual sets using word2vec

```
# Individual sets
import time
import torch
import transformers as ppb
import warnings
warnings.filterwarnings('ignore')
set count = 1
all sets score = []
# Hyperparameters for word2vec
num features = 400
min word count = 40
num workers = 4
context = 10
downsampling = 1e-3
epochs = 30
# Hyperpaprameters for LSTM
Hidden dim1=300
Hidden_dim2=100
return sequences = True
dropout=0.5
recurrent dropout=0.4
input size=400
activation='relu'
bidirectional = True
batch size = 64
epoch = 70
#####
####
import tensorflow as tf
tf.keras.backend.clear session()
for s in sets:
 print("\n----SET {}----\n".format(set count))
 set count +=1
 X = s
 y = s['domain1 score']
  cv = KFold(n splits=5, shuffle=True)
 #X, y = prepare data(dataset path=dataset path)
 cv data = cv.split(X)
  results = []
 prediction list = []
  fold count =1
 # hyperparameters for word2vec
 most common words= []
 print(X.shape)
 print(y.shape)
  for traincy, testcy in cy data:
      print("\n----Fold {}----\n".format(fold count))
      # get the train and test from the dataset.
```

```
X_train, X_test, y_train, y_test = X.iloc[traincv], X.iloc[testcv], y.iloc[traincv]
    train essays = X train['essay']
    #print("y_train",y_train)
    test essays = X test['essay']
    #y train = torch.tensor(y train,dtype=torch.long)
    train sentences = []
    # print("train essay ",train essays.shape)
    #print(X_train.shape,y_train.shape)
    for essay in train essays:
        # get all the sentences from the essay
        train_sentences.append(essay_to_wordlist(essay, remove_stopwords = True))
    # word2vec embedding
    print("Converting sentences to word2vec model")
   model, = build word2vec(train sentences, num workers, num features, min word
                  downsampling)
    top10 = collections.defaultdict(int)
    # print("train sentencesshap",len(train sentences))
    trainDataVecs = np.array(getAvgFeatureVecs(train sentences, model, num feature
    test sentences = []
    for essay v in test essays:
        test_sentences.append(essay_to_wordlist(essay_v, remove stopwords=True))
    testDataVecs = np.array(getAvgFeatureVecs(test sentences, model, num features)
    trainDataVectors = np.reshape(trainDataVecs, (trainDataVecs.shape[0], 1, trair
    testDataVectors = np.reshape(testDataVecs, (testDataVecs.shape[0], 1, testData
    lstm model = get model lstm(Hidden dim1=Hidden dim1, Hidden dim2=Hidden dim2,
                            dropout=dropout, recurrent dropout=recurrent dropout,
                            activation=activation, bidirectional=bidirectional)
    # print(trainDataVectors.shape)
    # print(y train.shape)
   history = lstm model.fit(trainDataVectors, y train, batch size=batch size, epc
   plot accuracy curve(history)
   y pred = lstm model.predict(testDataVectors)
    y pred = np.around(y pred)
   np.nan to num(y pred)
    result = cohen kappa score(y test.values, y pred, weights='quadratic')
   print("Kappa Score: {}".format(result))
    results.append(result)
    fold count += 1
print("Average kappa score value is : {}".format(np.mean(np.asarray(results))))
all sets score.append(results)
```

 Γ_{\rightarrow}

```
----SET 1-----
(1783, 4)
(1783,)
-----Fold 1-----
Converting sentences to word2vec model
4 cores using
```

Time to build vocab using word2vec: 0.2673826217651367 sec Time to train the word2vec model: 9.049090385437012 mins Model: "sequential 1"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_1 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_2 (Bidirection | (None, | 200) | 560800 |
| dropout_1 (Dropout) | (None, | 200) | 0 |
| dense_1 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 | | | |

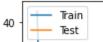
Trainable params: 2,243,401 Non-trainable params: 0

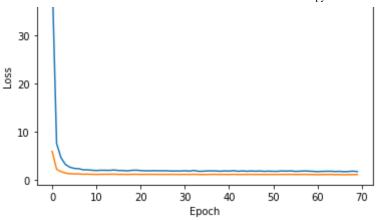
```
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Epoch 14/70
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Epoch 68/70
Epoch 69/70
Epoch 70/70
```

Model loss





Kappa Score: 0.5088826375493651

-----Fold 2----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.2600727081298828 sec Time to train the word2vec model: 9.034634828567505 mins Model: "sequential_2"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_3 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_4 (Bidirection | (None, | 200) | 560800 |
| dropout_2 (Dropout) | (None, | 200) | 0 |
| dense_2 (Dense) | (None, | 1) | 201 |

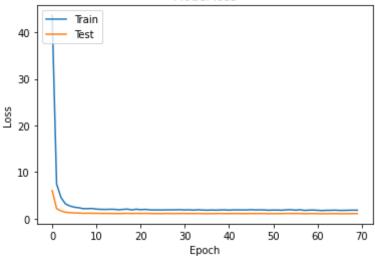
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70

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Kappa Score: 0.5837948120081609

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.26175808906555176 sec Time to train the word2vec model: 8.970890998840332 mins Model: "sequential 3"

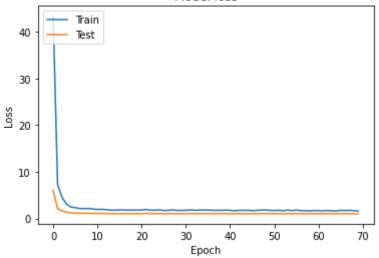
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_5 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_6 (Bidirection | (None, | 200) | 560800 |
| dropout_3 (Dropout) | (None, | 200) | 0 |
| dense_3 (Dense) | (None, | 1) | 201 |
| matal manage 2 242 401 | | | |

Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

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```

Model loss



Kappa Score: 0.4902762050120625

-----Fold 4----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.2515127658843994 sec Time to train the word2vec model: 8.912643671035767 mins Model: "sequential 4"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_7 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_8 (Bidirection | (None, | 200) | 560800 |
| dropout_4 (Dropout) | (None, | 200) | 0 |
| dense_4 (Dense) | (None, | 1) | 201 |

Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

```
Epoch 1/70
```

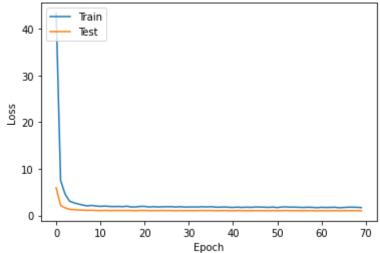
Epoch 2//0

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```

Model loss



Kappa Score: 0.5271526035131744

-----Fold 5----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.25843358039855957 sec Time to train the word2vec model: 8.947765588760376 mins Model: "sequential 5"

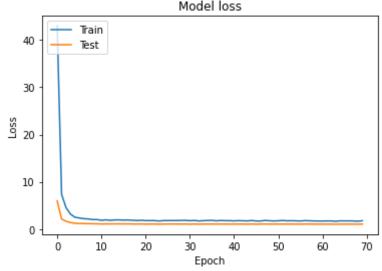
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_9 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_10 (Bidirectio | (None, | 200) | 560800 |
| dropout_5 (Dropout) | (None, | 200) | 0 |
| dense_5 (Dense) | (None, | 1) | 201 |

```
Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0
```

```
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Epoch 70/70
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Kappa Score: 0.450233353695785
Average kappa score value is : 0.5120679223557096

(1800, 7) (1800,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

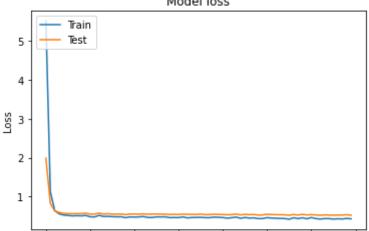
Time to build vocab using word2vec: 0.25551414489746094 sec Time to train the word2vec model: 8.659111022949219 mins Model: "sequential_6"

| Layer (type) | Output Shape | | Param # | |
|---|------------------------------|---------|-------------------|------------------|
| bidirectional_11 (Bidirecti | o (None, 1, 600) | ===== | 1682400 | |
| bidirectional_12 (Bidirecti | o (None, 200) | | 560800 | |
| dropout_6 (Dropout) | (None, 200) | | 0 | |
| dense_6 (Dense) | (None, 1) | | 201 | |
| Total params: 2,243,401 Trainable params: 2,243,401 | | | | |
| Non-trainable params: 0 | | | | |
| Epoch 1/70 1440/1440 [=================================== |] - | 2s 1 | ms/step - loss: 5 | 5.5126 - mae: 1. |
| 1440/1440 [=================================== | =====1 - | 0s 3 | 20us/step - loss: | : 1.1251 - mae: |
| 1440/1440 [======== | ======] - | 0s 3 | 32us/step - loss: | : 0.6392 - mae: |
| Epoch 4/70 1440/1440 [=================================== | =====] - | 0s 3 | 28us/step - loss: | : 0.5555 - mae: |
| Epoch 5/70 1440/1440 [======== | =====] - | 0s 3 | 44us/step - loss: | : 0.5239 - mae: |
| Epoch 6/70 1440/1440 [======== | ======] - | 0s 3 | 22us/step - loss: | : 0.5140 - mae: |
| Epoch 7/70 1440/1440 [========= | =====] - | 0s 3 | 24us/step - loss: | : 0.5031 - mae: |
| Epoch 8/70 1440/1440 [=================================== | ======] - | 1s 3 | 53us/step - loss: | : 0.5087 - mae: |
| Epoch 9/70 1440/1440 [=================================== | ======] - | 0s 3 | 35us/step - loss: | : 0.5031 - mae: |
| Epoch 10/70 1440/1440 [=================================== | =====] - | 1s 3 | 49us/step - loss: | : 0.5145 - mae: |
| Epoch 11/70 1440/1440 [=================================== | | | | |
| Epoch 12/70 1440/1440 [======== | - | | - | |
| Epoch 13/70 1440/1440 [======== | | | | |
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| Epoch 16/70 | | | | |
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| 1440/1440 [======= Epoch 18/70 | | | | |
| 1440/1440 [======= Epoch 19/70 | | | | |
| 1440/1440 [======= Epoch 20/70 | ======] - | 0s 3 | 30us/step - loss: | : 0.4575 - mae: |
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60 70 Epoch

Kappa Score: 0.4659624413145539

-----Fold 2-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.2505044937133789 sec Time to train the word2vec model: 8.646145343780518 mins Model: "sequential 7"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| bidirectional_13 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_14 (Bidirectio | (None, | 200) | 560800 |
| dropout_7 (Dropout) | (None, | 200) | 0 |
| dense_7 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 Trainable params: 2,243,401 | | | |

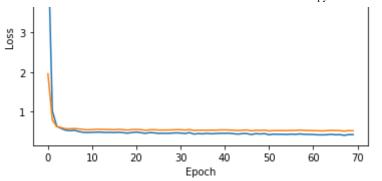
Non-trainable params: 0

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Epoch 1/70
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Epoch 3/70
Epoch 4/70
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Epoch 8/70
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Epoch 68/70
Epoch 69/70
Epoch 70/70
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-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.25393176078796387 sec Time to train the word2vec model: 8.690581560134888 mins Model: "sequential 8"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_15 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_16 (Bidirectio | (None, | 200) | 560800 |
| dropout_8 (Dropout) | (None, | 200) | 0 |
| dense_8 (Dense) | (None, | 1) | 201 |

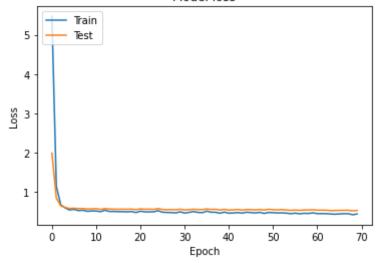
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Epoch 68/70
Epoch 69/70
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Model loss



Kappa Score: 0.4062281503791749

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.25275254249572754 sec Time to train the word2vec model: 8.501373767852783 mins Model: "sequential 9"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_17 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_18 (Bidirectio | (None, | 200) | 560800 |
| dropout_9 (Dropout) | (None, | 200) | 0 |
| dense_9 (Dense) | (None, | 1) | 201 |

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Model loss 5 - Train Test 4 - 2 - 1 - 1

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Kappa Score: 0.4308035714285714

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-----Fold 5----

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Converting sentences to word2vec model

4 cores using

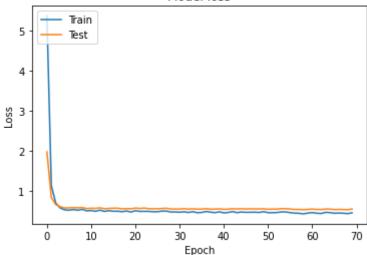
Time to build vocab using word2vec: 0.26012277603149414 sec Time to train the word2vec model: 8.555063486099243 mins Model: "sequential 10"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_19 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_20 (Bidirectio | (None, | 200) | 560800 |
| dropout_10 (Dropout) | (None, | 200) | 0 |
| dense_10 (Dense) | (None, | 1) | 201 |

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Kappa Score: 0.4639281129653402
Average kappa score value is : 0.4491351271745228

----SET 3-----

(1726, 4)
(1726,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

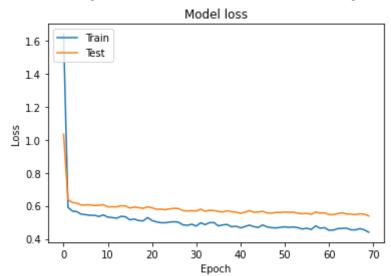
Time to build vocab using word2vec: 0.11465001106262207 sec Time to train the word2vec model: 2.1772799491882324 mins Model: "sequential 11"

| Layer (type) | Output Shape Param | # |
|---|----------------------|-------|
| ======================================= | | ===== |
| bidirectional_21 (Bidirection | (None, 1, 600) 16824 | 00 |
| bidirectional 22 (Bidirectio | (None, 200) 56080 | 0 |

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dropout 11 (Dropout)
     (None, 200)
          \cap
dense 11 (Dense)
          201
     (None, 1)
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Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0
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Epoch 70/70
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-----Fold 2----

Converting sentences to word2vec model

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4 cores using
Time to build vocab using word2vec: 0.10076594352722168 sec
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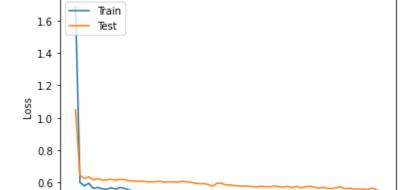
AES.ipynb - Colaboratory

| Time to train the wordzvec model: "sequential_12" | OQE1: 2.1848223209381104 | mins |
|---|--------------------------|---------|
| Layer (type) | Output Shape | Param # |
| bidirectional_23 (Bidirectio | (None, 1, 600) | 1682400 |
| bidirectional_24 (Bidirectio | (None, 200) | 560800 |
| dropout_12 (Dropout) | (None, 200) | 0 |
| dense_12 (Dense) | (None, 1) | 201 |
| Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0 | | |
| Epoch 1/70 1381/1381 [==================================== | - | _ |

.6830 - mae: 1. 0.6016 - mae:Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70 Epoch 18/70 Epoch 19/70 Epoch 20/70 Epoch 21/70

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Epoch

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-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.10247254371643066 sec Time to train the word2vec model: 2.214927911758423 mins Model: "sequential_13"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_25 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_26 (Bidirectio | (None, | 200) | 560800 |
| dropout_13 (Dropout) | (None, | 200) | 0 |
| dense_13 (Dense) | (None, | 1) | 201 |

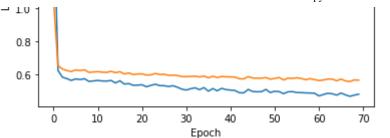
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70

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-----Fold 4-----

Converting sentences to word2vec model

4 cores using

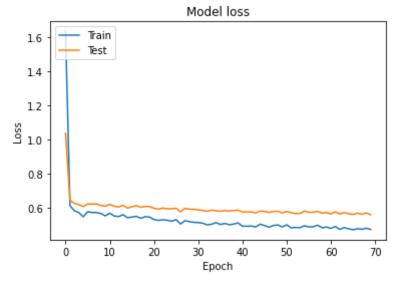
Time to build vocab using word2vec: 0.10321426391601562 sec Time to train the word2vec model: 2.1885085105895996 mins Model: "sequential_14"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_27 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_28 (Bidirectio | (None, | 200) | 560800 |
| dropout_14 (Dropout) | (None, | 200) | 0 |
| dense_14 (Dense) | (None, | 1) | 201 |

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Kappa Score: 0.38100263852242744

-----Fold 5-----

Converting sentences to word2vec model

4 cores using

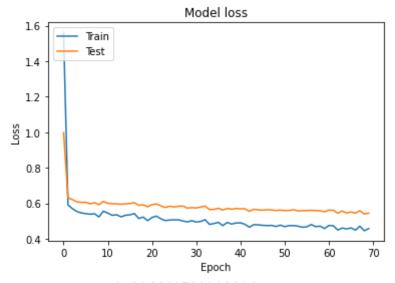
Time to build vocab using word2vec: 0.10185909271240234 sec Time to train the word2vec model: 2.165205955505371 mins Model: "sequential_15"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_29 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_30 (Bidirectio | (None, | 200) | 560800 |
| dropout_15 (Dropout) | (None, | 200) | 0 |
| dense_15 (Dense) | (None, | 1) | 201 |

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Kappa Score: 0.316661722913816
Average kappa score value is : 0.37290583430412055

----SET 4-----

(1770, 4)
(1770,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.07589459419250488 sec Time to train the word2vec model: 1.699512004852295 mins Model: "sequential_16"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_31 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_32 (Bidirectio | (None, | 200) | 560800 |
| dropout_16 (Dropout) | (None, | 200) | 0 |
| dense_16 (Dense) | (None, | 1) | 201 |

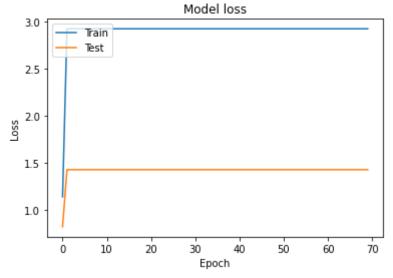
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

Epoch 1/70

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-----Fold 2----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.07567834854125977 sec Time to train the word2vec model: 1.6969597339630127 mins Model: "sequential_17"

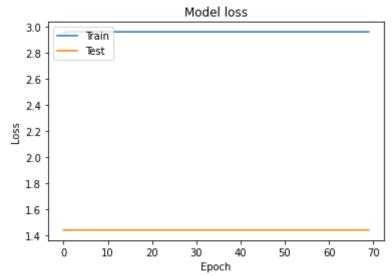
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_33 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_34 (Bidirectio | (None, | 200) | 560800 |
| dropout_17 (Dropout) | (None, | 200) | 0 |

dense_17 (Dense) (None, 1) 201

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Epoch 10/70
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Epoch 25/70
Epoch 26/70
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Epoch 27/70
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Epoch 46/70
Epoch 47/70
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Epoch 51/70
Epoch 52/70
Epoch 53/70
Epoch 54/70
Epoch 55/70
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Epoch 56/70
Epoch 57/70
Epoch 58/70
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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```



-----Fold 3-----

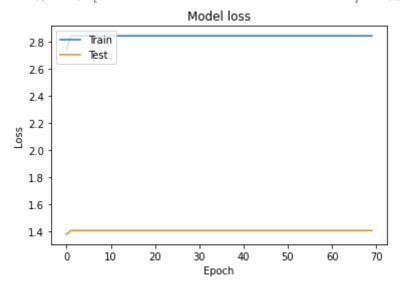
Converting sentences to word2vec model

4 cores using
Time to build vocab using word2vec: 0.07494425773620605 sec
Time to train the word2vec model: 1.7165570259094238 mins
Model: "sequential 18"

```
Output Shape
Layer (type)
            Param #
______
bidirectional 35 (Bidirectio (None, 1, 600)
            1682400
bidirectional_36 (Bidirectio (None, 200)
            560800
dropout 18 (Dropout)
      (None, 200)
dense 18 (Dense)
            201
      (None, 1)
______
Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0
Epoch 1/70
Epoch 2/70
Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
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Epoch 20/70
Epoch 21/70
Epoch 22/70
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Epoch 23/70
Epoch 24/70
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Epoch 42/70
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Epoch 52/70
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Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```



Kappa Score: 0.0

Converting sentences to word2vec model

```
4 cores using
```

Time to build vocab using word2vec: 0.07524967193603516 sec Time to train the word2vec model: 1.6358120441436768 mins Model: "sequential 19"

| Layer (type) | Output | Shape | Param # |
|---|--------|---------|---------|
| bidirectional_37 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_38 (Bidirectio | (None, | 200) | 560800 |
| dropout_19 (Dropout) | (None, | 200) | 0 |
| dense_19 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 Trainable params: 2,243,401 | | | |

Trainable params: 2,243,401 Non-trainable params: 0

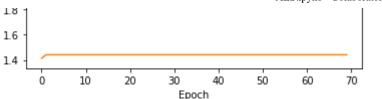
Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70 Epoch 18/70

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Epoch 19/70
Epoch 20/70
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Epoch 48/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```







----Fold 5----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.07580757141113281 sec Time to train the word2vec model: 1.682042121887207 mins Model: "sequential_20"

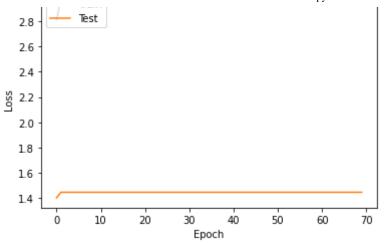
| Layer (type) | Output Shap | e Param # |
|-----------------------------|---------------|-------------|
| bidirectional_39 (Bidirecti | o (None, 1, 6 | 00) 1682400 |
| bidirectional_40 (Bidirecti | o (None, 200) | 560800 |
| dropout_20 (Dropout) | (None, 200) | 0 |
| dense_20 (Dense) | (None, 1) | 201 |
| Motol marange 2 242 401 | | |

Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70

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Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```



Average kappa score value is: 0.0

----SET 5----

(1805, 4) (1805,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.10522055625915527 sec Time to train the word2vec model: 2.5224337577819824 mins Model: "sequential 21"

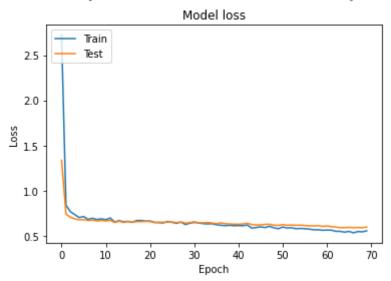
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_41 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_42 (Bidirectio | (None, | 200) | 560800 |
| dropout_21 (Dropout) | (None, | 200) | 0 |
| dense_21 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 | | | |

Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0

Epoch 1/70

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Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
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Epoch 14/70
Epoch 15/70
Epoch 16/70
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Epoch 63/70
Epoch 64/70
```



-----Fold 2----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.10744452476501465 sec Time to train the word2vec model: 2.601982831954956 mins Model: "sequential 22"

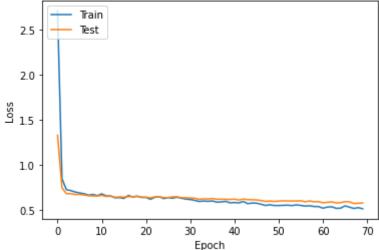
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_43 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_44 (Bidirectio | (None, | 200) | 560800 |
| dropout_22 (Dropout) | (None, | 200) | 0 |
| dense_22 (Dense) | (None, | 1) | 201 |
| | | | |

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Epoch 10/70
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Epoch 32/70
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Epoch 60/70
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Epoch 61/70 Epoch 62/70 Epoch 63/70 Epoch 64/70 Epoch 65/70 Epoch 66/70 Epoch 67/70 Epoch 68/70 Epoch 69/70 Epoch 70/70

Model loss



Kappa Score: 0.5271833588143604

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.10084843635559082 sec Time to train the word2vec model: 2.571183204650879 mins Model: "sequential 23"

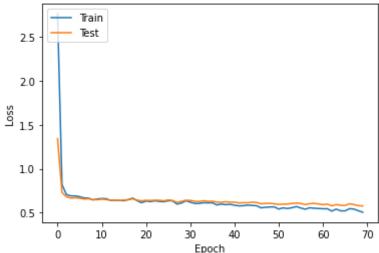
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_45 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_46 (Bidirectio | (None, | 200) | 560800 |
| dropout_23 (Dropout) | (None, | 200) | 0 |
| dense_23 (Dense) | (None, | 1) | 201 |

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Epoch 1/70
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Epoch 56/70
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Epoch 63/70
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Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```

Model loss



Kappa Score: 0.5436060998704276

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

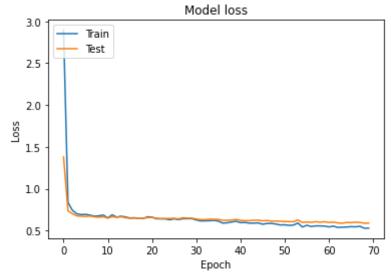
Time to build vocab using word2vec: 0.10166358947753906 sec Time to train the word2vec model: 2.61022686958313 mins Model: "sequential 24"

Layer (type) Output Shape Param #

```
bidirectional 47 (Bidirectio (None, 1, 600)
           1682400
bidirectional 48 (Bidirectio (None, 200)
           560800
dropout 24 (Dropout)
      (None, 200)
dense 24 (Dense)
      (None, 1)
           201
______
Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0
Epoch 1/70
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Epoch 3/70
Epoch 4/70
Epoch 5/70
Epoch 6/70
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Epoch 9/70
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Epoch 12/70
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Epoch 24/70
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        1---- 0 5605
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```



-----Fold 5-----

4 cores using Time to build vocab using word2vec: 0.10695171356201172 sec Time to train the word2vec model: 2.609471321105957 mins

| Model: "sequential_25" | | | | | |
|---|--------|----------|------|-------------------|------------------|
| Layer (type) | Output | _ | | Param # | _ |
| bidirectional_49 (Bidirectio | | | ==== | 1682400 | = |
| bidirectional_50 (Bidirectio | (None, | 200) | | 560800 | _ |
| dropout_25 (Dropout) | (None, | 200) | | 0 | _ |
| dense_25 (Dense) | (None, | 1) | | 201 | = |
| Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0 | | | | | |
| Epoch 1/70 1444/1444 [================================== | | ====] - | 2s | 1ms/step - loss: | 2.7834 - mae: 1. |
| Epoch 2/70 1444/1444 [================================== | -==== | =====] - | 0s | 314us/step - loss | s: 0.8297 - mae: |
| 1444/1444 [================================== | :===== | =====] - | 0s | 326us/step - los | s: 0.7483 - mae: |
| 1444/1444 [================================== | | =====] - | 0s | 312us/step - los | s: 0.7139 - mae: |
| 1444/1444 [================================== | :===== | | 0s | 326us/step - loss | s: 0.7223 - mae: |
| 1444/1444 [================================== | | =====] - | 1s | 360us/step - loss | s: 0.7040 - mae: |
| 1444/1444 [================================== | -===== | =====] - | 0s | 336us/step - los | s: 0.7040 - mae: |
| 1444/1444 [================================== | | =====] - | 1s | 350us/step - loss | s: 0.6815 - mae: |
| 1444/1444 [================================== | | - | | - | |
| 1444/1444 [================================== | | - | | - | |
| 1444/1444 [================================== | | _ | | _ | |
| 1444/1444 [================================== | | - | | _ | |
| 1444/1444 [================================== | -===== |] - | 1s | 374us/step - loss | s: 0.6746 - mae: |

Epoch 15/70

Epoch 16/70

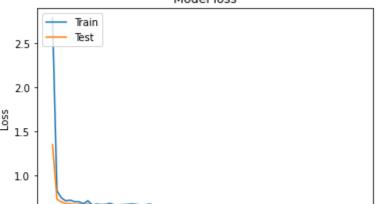
Epoch 17/70

Epoch 19/70 0a 220ma/aton logg. 0 6002

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0.5 - 0 10 20 30 40 50 60 70 Epoch
```

Kappa Score: 0.5960593529554852
Average kappa score value is : 0.5505353484668758

----SET 6----

(1800, 4) (1800,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

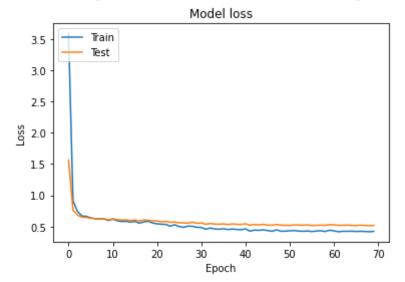
Time to build vocab using word2vec: 0.11388039588928223 sec Time to train the word2vec model: 3.7647345066070557 mins Model: "sequential 26"

| Layer (type) | Output | Shape | Param # |
|-------------------------------|--------|---------|---------|
| bidirectional_51 (Bidirection | None, | 1, 600) | 1682400 |
| bidirectional_52 (Bidirection | None, | 200) | 560800 |
| dropout_26 (Dropout) | (None, | 200) | 0 |
| dense_26 (Dense) | (None, | 1) | 201 |
| | | | |

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Epoch 1/70
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Epoch 69/70
Epoch 70/70
```



Kappa Score: 0.6844032624979193

-----Fold 2-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.11828279495239258 sec Time to train the word2vec model: 3.745845317840576 mins Model: "sequential 27"

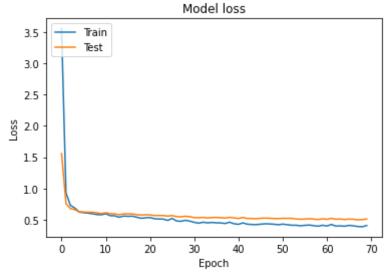
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_53 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_54 (Bidirectio | (None, | 200) | 560800 |
| dropout_27 (Dropout) | (None, | 200) | 0 |
| dense_27 (Dense) | (None, | 1) | 201 |

Total params: 2,243,401
Trainable params: 2,243,401

Non-trainable params: 0

```
Epoch 9/70
Epoch 10/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
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Kappa Score: 0.6516764839148165

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.11356282234191895 sec Time to train the word2vec model: 3.746948719024658 mins Model: "sequential_28"

| Output | Shape | Param # |
|--------|----------------------|--------------|
| (None, | 1, 600) | 1682400 |
| (None, | 200) | 560800 |
| (None, | 200) | 0 |
| (None, | 1) | 201 |
| | (None, (None, (None, | Output Shape |

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Epoch 62/70 Epoch 63/70 Epoch 64/70 Epoch 65/70 Epoch 66/70 Epoch 67/70 Epoch 68/70 Epoch 69/70 Epoch 70/70

Model loss 3.5 Train Test 3.0 2.5 S 2.0 1.5 1.0 0.5 10 20 30 40 50 60 Epoch

Kappa Score: 0.6902627511591963

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.11386537551879883 sec Time to train the word2vec model: 3.760929822921753 mins Model: "sequential 29"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_57 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_58 (Bidirectio | (None, | 200) | 560800 |
| dropout_29 (Dropout) | (None, | 200) | 0 |
| dense_29 (Dense) | (None, | 1) | 201 |

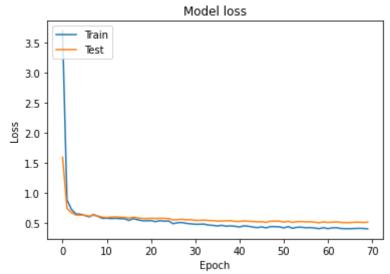
Total params: 2,243,401
Trainable params: 2,243,401

Non trainable narame. 1

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Epoch 70/70
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Kappa Score: 0.6692696371152963

-----Fold 5----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.11177539825439453 sec Time to train the word2vec model: 3.74564266204834 mins Model: "sequential 30"

| Layer (type) | | Output | Sh | ape | Param # |
|------------------|-------------|--------|-----|--------|---|
| ============ | | | === | ====== | ======================================= |
| bidirectional_59 | (Bidirectio | (None, | 1, | 600) | 1682400 |

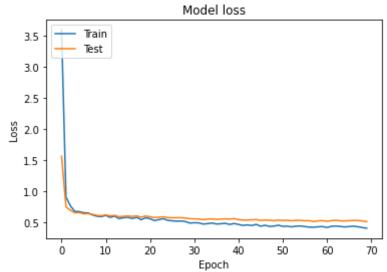
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560800

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dropout 30 (Dropout)
     (None, 200)
dense 30 (Dense)
     (None, 1)
         2.01
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Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0
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Kappa Score: 0.6854368932038835
Average kappa score value is: 0.6762098055782224
----SET 7-----

(1569, 12) (1569,)

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-----Fold 1-----
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Converting sentences to word2vec model

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4 cores using
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Time to build vocab using word2vec: 0.11403012275695801 sec Time to train the word2vec model: 2.6068851947784424 mins Model: "sequential_31"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_61 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_62 (Bidirectio | (None, | 200) | 560800 |
| dropout_31 (Dropout) | (None, | 200) | 0 |
| dense_31 (Dense) | (None, | 1) | 201 |

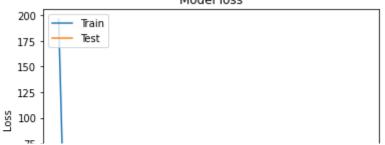
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

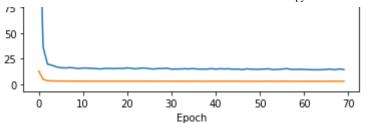
Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70 Epoch 17/70

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Kappa Score: 0.5722448373531612

-----Fold 2----

Converting sentences to word2vec model

4 cores using

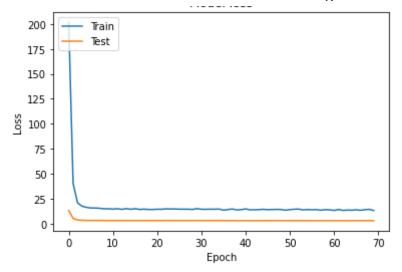
Time to build vocab using word2vec: 0.11784553527832031 sec Time to train the word2vec model: 2.6329636573791504 mins Model: "sequential 32"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_63 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_64 (Bidirectio | (None, | 200) | 560800 |
| dropout_32 (Dropout) | (None, | 200) | 0 |
| dense_32 (Dense) | (None, | 1) | 201 |

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Epoch 69/70
Epoch 70/70
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Kappa Score: 0.5305514870967014

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

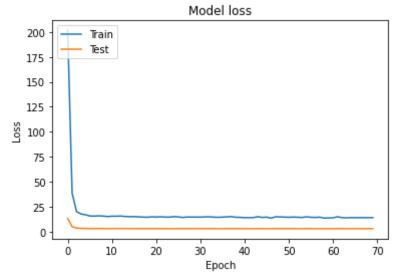
Time to build vocab using word2vec: 0.11901736259460449 sec Time to train the word2vec model: 2.6486480236053467 mins Model: "sequential 33"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_65 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_66 (Bidirectio | (None, | 200) | 560800 |
| dropout_33 (Dropout) | (None, | 200) | 0 |
| dense_33 (Dense) | (None, | 1) | 201 |

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Epoch 67/70
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Kappa Score: 0.4939329354097284

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

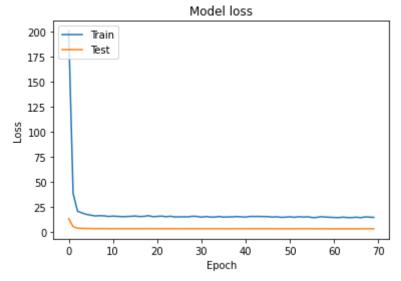
Time to build vocab using word2vec: 0.11491894721984863 sec Time to train the word2vec model: 2.6387171745300293 mins Model: "sequential_34"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_67 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_68 (Bidirectio | (None, | 200) | 560800 |
| dropout_34 (Dropout) | (None, | 200) | 0 |
| dense_34 (Dense) | (None, | | 201 |

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Kappa Score: 0.5686159728088649

----Fold 5----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.11940550804138184 sec Time to train the word2vec model: 2.646247148513794 mins Model: "sequential_35"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_69 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_70 (Bidirectio | (None, | 200) | 560800 |
| dropout_35 (Dropout) | (None, | 200) | 0 |
| dense_35 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 | | | |

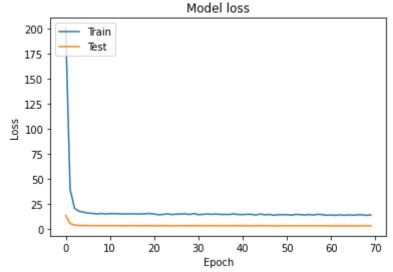
Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0

Epoch 1/70

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Kappa Score: 0.4923584460109499
Average kappa score value is : 0.5315407357358811

----SET 8-----

(723, 16)
(723,)

-----Fold 1-----

Converting sentences to word2vec model

4 cores using Time to build vocab using word2vec: 2.5109870433807373 sec Time to train the word2vec model: 5.419142246246338 mins

https://colab.research.google.com/drive/12mjvzeAtodzzStteTYnLYnvVLkhBJlnM#scrollTo=zOi-yY2JkzPV&printMode=true

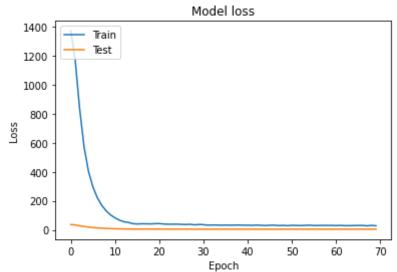
Time to train the word2vec model: 5.419142246246338 mins Model: "sequential_36"

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|---|--------|------|--------|----------|--------|-------|----------------------|
| bidirectional_71 (Bidirectio | | | | ====== | 1682 | | = |
| bidirectional_72 (Bidirectio | (None, | 200 |) | | 5608 | 0 0 | _ |
| dropout_36 (Dropout) | (None, | 200 |) | | 0 | | _ |
| dense_36 (Dense) | (None, | | | | 201 | | _ |
| Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0 | | | | | | | = |
| Epoch 1/70 578/578 [==================================== | ===== | ==== |] – 2s | 3ms/step | o – lo | ss: 1 | - 373.4154 - mae: |
| Epoch 2/70 578/578 [==================================== | | ==== |] – 0s | 397us/st | tep - | loss: | 1166.7572 - mad |
| Epoch 3/70 578/578 [================= Epoch 4/70 | ===== | ==== |] - 0s | 396us/st | ep - | loss: | 833.3136 - mae |
| - 578/578 [==================================== | ===== | ==== |] - 0s | 383us/st | ep - | loss: | 571.8035 - mae |
| Spoch 5/70 378/578 [==================================== | ===== | ==== |] - 0s | 423us/st | ep - | loss: | 402.4288 - mae |
| .poen 6/70 178/578 [==================================== | | ==== |] - 0s | 421us/st | tep - | loss: | 295.4078 - mae |
| - 78/578 [==================================== | ===== | ==== |] - 0s | 407us/st | ep - | loss: | 221.3558 - mae |
| Epoch 8/70 578/578 [==================================== | | ==== |] - 0s | 381us/st | tep - | loss: | 168.7003 - mae |
| 578/578 [==================================== | | ==== |] - 0s | 337us/st | tep - | loss: | 130.5938 - mae |
| poch 10/70 578/578 [==================================== | ===== | ==== |] - 0s | 357us/st | tep - | loss: | 102.7721 - mae |
| 578/578 [==================================== | ===== | ==== |] - 0s | 373us/st | tep - | loss: | 82.5618 - mae: |
| 78/578 [==================================== | | ==== |] - 0s | 401us/st | tep - | loss: | 66.7911 - mae: |
| 578/578 [==================================== | ====== | ==== |] - 0s | 346us/st | tep - | loss: | 55.6692 - mae: |
| 78/578 [==================================== | ====== | ==== |] - 0s | 393us/st | tep - | loss: | 51.2155 - mae: |
| 78/578 [==================================== | ===== | ==== |] - 0s | 398us/st | cep - | loss: | 42.8587 - mae: |
| 78/578 [==================================== | ===== | ==== |] - 0s | 415us/st | tep - | loss: | 40.4166 - mae: |
| 78/578 [==================================== | ====== | ==== |] - 0s | 398us/st | tep - | loss: | 42.0686 - mae: |
| 78/578 [==================================== | ===== | ==== |] - 0s | 344us/st | cep - | loss: | 41.6147 - mae: |
| 78/578 [==================================== | | | | | | | |
| 78/578 [==================================== | | | | | | | |
| 578/578 [============== Epoch 22/70 | | ==== |] - 0s | 406us/st | cep - | loss: | 43.3382 - mae: |
| 578/578 [==================================== | ===== | ==== |] - 0s | 406us/st | ep - | loss: | 40.1957 - mae: |

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Epoch 23/70
Epoch 24/70
Epoch 25/70
578/578 [============== ] - 0s 398us/step - loss: 39.3646 - mae: 4
Epoch 26/70
Epoch 27/70
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Epoch 29/70
Epoch 30/70
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Epoch 51/70
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Epoch 52/70
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Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```



Kappa Score: 0.3679723400168441

-----Fold 2----

Converting sentences to word2vec model

```
4 cores using
```

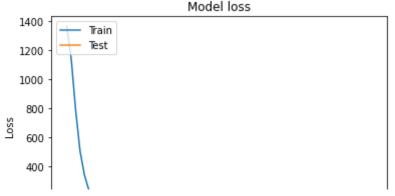
Time to build vocab using word2vec: 0.1986532211303711 sec Time to train the word2vec model: 5.398674964904785 mins Model: "sequential 37"

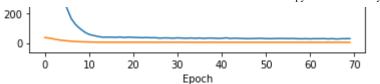
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_73 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_74 (Bidirectio | (None, | 200) | 560800 |
| dropout_37 (Dropout) | (None, | 200) | 0 |
| dense_37 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 | | | |

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Epoch 1/70
Epoch 2/70
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Epoch 4/70
Epoch 5/70
Epoch 6/70
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Epoch 8/70
Epoch 9/70
Epoch 10/70
Epoch 11/70
Epoch 12/70
Epoch 13/70
578/578 [=============== ] - 0s 411us/step - loss: 44.4210 - mae: 5
Epoch 14/70
Epoch 15/70
Epoch 16/70
Epoch 17/70
Epoch 18/70
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Epoch 19/70
Epoch 20/70
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Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```





Kappa Score: 0.39736449631321513

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.18714141845703125 sec Time to train the word2vec model: 5.236833095550537 mins Model: "sequential_38"

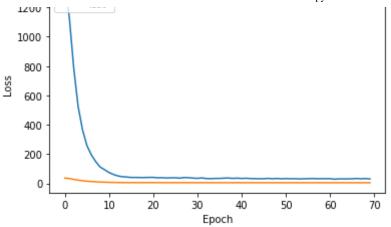
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_75 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_76 (Bidirectio | (None, | 200) | 560800 |
| dropout_38 (Dropout) | (None, | 200) | 0 |
| dense_38 (Dense) | (None, | 1) | 201 |

Total params: 2,243,401
Trainable params: 2,243,401
Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70

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Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
578/578 [============== ] - 0s 419us/step - loss: 30.1103 - mae: 4
```



Kappa Score: 0.4476324370665592

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

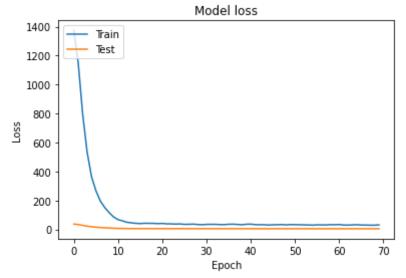
Time to build vocab using word2vec: 0.19294214248657227 sec Time to train the word2vec model: 5.454136371612549 mins Model: "sequential_39"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_77 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_78 (Bidirectio | (None, | 200) | 560800 |
| dropout_39 (Dropout) | (None, | 200) | 0 |
| dense_39 (Dense) | (None, | 1) | 201 |

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    Epoch 4/70
579/579 [======
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Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
579/579 [======
      ========] - 0s 335us/step - loss: 114.8187 - mae:
Epoch 10/70
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Epoch 11/70
Epoch 12/70
Epoch 13/70
Epoch 14/70
Epoch 15/70
Epoch 16/70
Epoch 17/70
Epoch 18/70
Epoch 19/70
Epoch 20/70
Epoch 21/70
Epoch 22/70
579/579 [============== ] - 0s 350us/step - loss: 38.0189 - mae: 4
Epoch 23/70
Epoch 24/70
Epoch 25/70
Epoch 26/70
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Epoch 30/70
Epoch 31/70
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Epoch 38/70
Epoch 39/70
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Epoch 40/70
Epoch 41/70
Epoch 42/70
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Epoch 48/70
Epoch 49/70
Epoch 50/70
Epoch 51/70
Epoch 52/70
579/579 [============== ] - 0s 334us/step - loss: 31.8550 - mae: 4
Epoch 53/70
Epoch 54/70
Epoch 55/70
Epoch 56/70
Epoch 57/70
579/579 [============= ] - Os 327us/step - loss: 30.5199 - mae: 4
Epoch 58/70
Epoch 59/70
Epoch 60/70
Epoch 61/70
Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
```



Kappa Score: 0.45641025641025645

-----Fold 5-----

Converting sentences to word2vec model

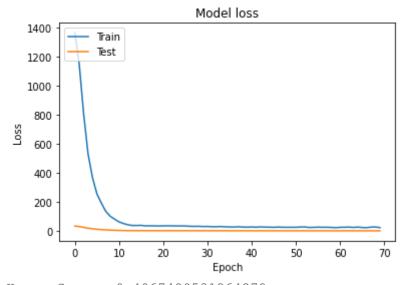
4 cores using

Time to build vocab using word2vec: 0.19194602966308594 sec Time to train the word2vec model: 5.196256160736084 mins Model: "sequential_40"

| T (1) | 0 1 1 | 21 | D // |
|------------------------------|--------|---|---------|
| Layer (type) | Output | Snape | Param # |
| bidirectional_79 (Bidirectio | (None, | 1, 600) | 1682400 |
| bidirectional_80 (Bidirectio | (None, | 200) | 560800 |
| dropout_40 (Dropout) | (None, | 200) | 0 |
| dense_40 (Dense) | (None, | 1) | 201 |
| Total params: 2,243,401 | ====== | ======================================= | |

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579/579 [============= ] - Os 363us/step - loss: 40.5993 - mae: 5
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Epoch 62/70
Epoch 63/70
Epoch 64/70
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Kappa Score: 0.4067490531964879
Average kappa score value is : 0.41522571660067253

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Below method is for running the model on whole dataset using the word2vec model.

elow method is for running the word2vec model.

Whole Dataset Word2vec

```
X= data
y = data['domain1 score']
import time
import torch
import transformers as ppb
import warnings
warnings.filterwarnings('ignore')
set count = 1
all sets score = []
# Hyperparameters for word2vec
num features = 400
min word count = 40
num workers = 4
context = 10
downsampling = 1e-3
epochs = 30
# Hyperpaprameters for LSTM
Hidden dim1=300
Hidden dim2=100
return sequences = True
dropout=0.5
recurrent dropout=0.4
input size=400
activation='relu'
bidirectional = True
batch size = 64
epoch = 70
#####
####
import tensorflow as tf
tf.keras.backend.clear session()
cv = KFold(n splits=5, shuffle=True)
#X, y = prepare data(dataset path=dataset path)
cv data = cv.split(X)
results = []
prediction list = []
fold count =1
# hyperparameters for word2vec
most common words= []
print(X.shape)
print(y.shape)
for traincy, testcy in cy data:
    print("\n----Fold {}-----\n".format(fold count))
    # get the train and test from the dataset.
    X train, X test, y train, y test = X.iloc[traincv], X.iloc[testcv], y.iloc[traincv]
    train essays = X train['essay']
    #print("y train",y train)
    test essays = X test['essay']
    #y train = torch.tensor(y train,dtype=torch.long)
    train sentences = []
    # print("train essay ",train_essays.shape)
```

```
#print(X train.shape,y train.shape)
         for essay in train essays:
                  # get all the sentences from the essay
                  train sentences.append(essay to wordlist(essay, remove stopwords = True))
         # word2vec embedding
         print("Converting sentences to word2vec model")
         model, = build word2vec(train sentences, num workers, num features, min word co
                                         downsampling)
         top10 = collections.defaultdict(int)
         # print("train sentencesshap",len(train sentences))
         trainDataVecs = np.array(getAvgFeatureVecs(train sentences, model, num features)
         test sentences = []
         for essay v in test essays:
                  test sentences.append(essay to wordlist(essay v, remove stopwords=True))
         testDataVecs = np.array(getAvgFeatureVecs(test sentences, model, num features))
         trainDataVectors = np.reshape(trainDataVecs, (trainDataVecs.shape[0], 1, trainDataVecs.shape[0], 1, tr
         testDataVectors = np.reshape(testDataVecs, (testDataVecs.shape[0], 1, testDataVe
         lstm model = get model lstm(Hidden dim1=Hidden dim1, Hidden dim2=Hidden dim2, re
                                                                dropout=dropout, recurrent dropout=recurrent dropout, ir
                                                                activation=activation, bidirectional=bidirectional)
         # print(trainDataVectors.shape)
         # print(y train.shape)
         history = lstm model.fit(trainDataVectors, y train, batch size=batch size, epoch
         plot accuracy curve(history)
         y pred = lstm model.predict(testDataVectors)
         y pred = np.around(y pred)
         np.nan to num(y pred)
         result = cohen kappa score(y test.values, y pred, weights='quadratic')
         print("Kappa Score: {}".format(result))
         results.append(result)
         fold count += 1
print("Average kappa score value is : {}".format(np.mean(np.asarray(results))))
```

```
(12976, 4)
(12976,)
```

-----Fold 1-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.8619236946105957 sec Time to train the word2vec model: 48.41549491882324 mins Model: "sequential_1"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_1 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_2 (Bidirection | (None, | 200) | 560800 |
| dropout_1 (Dropout) | (None, | 200) | 0 |
| dense_1 (Dense) | (None, | 1) | 201 |

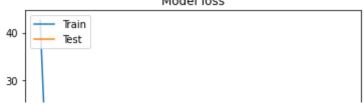
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

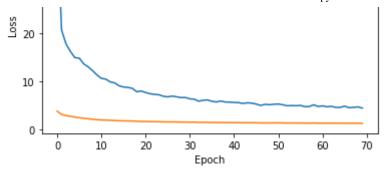
Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70 Epoch 13/70 Epoch 14/70 Epoch 15/70 Epoch 16/70

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Epoch 45/70
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| 10380/10380 | [=====] | _ | 3s | 323us/step | _ | loss: | 5.4346 | _ | mae |
|----------------------------|-----------|---|-----|---------------------------------------|---|-------|-------------|---|--------|
| Epoch 46/70 | | | | | | | | | |
| 10380/10380 | [=====] | _ | 3s | 327us/step | - | loss: | 5.2410 | - | mae |
| Epoch 47/70 | | | | | | _ | | | |
| 10380/10380 | [======] | _ | 3s | 315us/step | - | loss: | 4.9489 | _ | mae |
| Epoch 48/70 | | | | | | - | - 1006 | | |
| 10380/10380 | [======] | _ | 4s | 339us/step | - | loss: | 5.1836 | _ | mae |
| Epoch 49/70 | | | 4 | 222 | | 7 | E 00E1 | | |
| 10380/10380 | [=====] | _ | 4 S | 339us/step | - | loss: | 5.09/1 | _ | mae |
| Epoch 50/70 | [1 | | 2 ~ | 226/ | | 1000. | F 1010 | | |
| 10380/10380 Epoch 51/70 | [======] | _ | 35 | 320us/scep | _ | TOSS: | 3.1918 | _ | Illae |
| - | [======] | | 3 5 | 31011g/g+on | | 1000 | 5 2526 | | mao |
| Epoch 52/70 | [] | _ | JS | 319us/scep | _ | TOSS. | J. 2J20 | _ | illae |
| - | [=====] | _ | 35 | 327us/step | _ | loss: | 5.0945 | _ | mae |
| Epoch 53/70 | i j | | 0.0 | 02/05/5005 | | 1000 | 3 0 0 3 1 3 | | 111010 |
| _ | [======] | _ | 4s | 344us/step | _ | loss: | 4.8846 | _ | mae |
| Epoch 54/70 | · J | | | , , , , , , , , , , , , , , , , , , , | | | | | |
| 10380/10380 | [=======] | _ | 4s | 354us/step | _ | loss: | 4.9218 | _ | mae |
| Epoch 55/70 | | | | _ | | | | | |
| 10380/10380 | [======] | _ | 4s | 357us/step | _ | loss: | 4.8894 | _ | mae |
| Epoch 56/70 | | | | | | | | | |
| 10380/10380 | [======] | _ | 4s | 352us/step | - | loss: | 4.9530 | _ | mae |
| Epoch 57/70 | | | | | | | | | |
| | [======] | _ | 4s | 345us/step | - | loss: | 4.6893 | _ | mae |
| Epoch 58/70 | | | | | | | | | |
| 10380/10380 | [======] | _ | 4s | 350us/step | - | loss: | 4.7236 | _ | mae |
| Epoch 59/70 | | | | | | _ | | | |
| | [======] | _ | 4s | 338us/step | - | loss: | 5.0860 | _ | mae |
| Epoch 60/70 | | | 4 | 244 / 1 | | 7 | 4 7050 | | |
| Epoch 61/70 | [=====] | _ | 4 S | 344us/step | _ | loss: | 4./250 | _ | mae |
| _ | [======] | | 1 a | 252ug/g+op | | 1000 | 1 0666 | | m 2 0 |
| Epoch 62/70 | [] | _ | 45 | 333us/step | _ | 1055: | 4.0000 | _ | Illae |
| - | [=====] | _ | 4 9 | 342115/sten | _ | 1055: | 4.6634 | _ | mae |
| Epoch 63/70 | r 1 | | 10 | 312db/ bccp | | 1000. | 1.0001 | | mac |
| - | [======] | _ | 4s | 352us/step | _ | loss: | 4.7624 | _ | mae |
| Epoch 64/70 | · | | | 1 | | | | | |
| 10380/10380 | [======] | _ | 4s | 350us/step | _ | loss: | 4.5464 | _ | mae |
| Epoch 65/70 | | | | | | | | | |
| 10380/10380 | [======] | _ | 4s | 344us/step | _ | loss: | 4.5434 | _ | mae |
| Epoch 66/70 | | | | | | | | | |
| | [======] | _ | 4s | 342us/step | - | loss: | 4.8074 | _ | mae |
| Epoch 67/70 | | | | | | _ | | | |
| | [=====] | - | 3s | 336us/step | - | loss: | 4.4799 | - | mae |
| Epoch 68/70 | | | 0 | 240 | | 7 | 4 = 4 4 0 | | |
| | [=====] | - | 4S | 349us/step | - | TOSS: | 4.5443 | _ | mae |
| Epoch 69/70 | [======] | | 1 ~ | 3/0110/0+05 | | 1000 | 1 6507 | | mao |
| Epoch 70/70 | [| _ | 45 | Jaous/steb | _ | TOSS: | 4.000/ | _ | шае |
| _ | [======] | _ | 30 | 335115/sten | _ | 1055. | 4.3954 | _ | mae |
| 10000/1000 | | _ | 55 | оозин/ всер | | TODD. | 1.000 | | |

Model loss





Kappa Score: 0.9690772488848252

-----Fold 2----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.8998920917510986 sec Time to train the word2vec model: 48.410395860672 mins Model: "sequential 2"

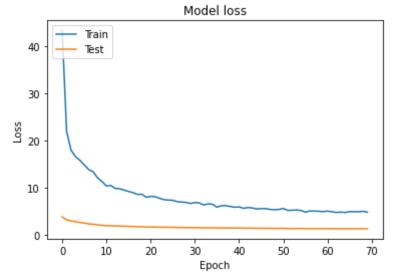
| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_3 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_4 (Bidirection | (None, | 200) | 560800 |
| dropout_2 (Dropout) | (None, | 200) | 0 |
| dense_2 (Dense) | (None, | 1) | 201 |

Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

Epoch 1/70 Epoch 2/70 Epoch 3/70 Epoch 4/70 Epoch 5/70 Epoch 6/70 Epoch 7/70 Epoch 8/70 Epoch 9/70 Epoch 10/70 Epoch 11/70 Epoch 12/70

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Epoch 69/70
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Kappa Score: 0.9723570173189542

-----Fold 3-----

Converting sentences to word2vec model

4 cores using

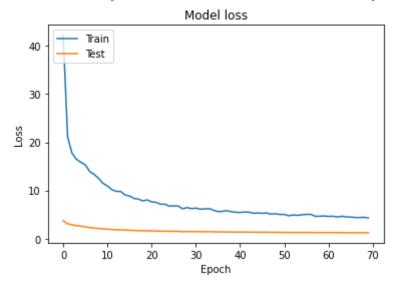
Time to build vocab using word2vec: 0.8663942813873291 sec Time to train the word2vec model: 47.800869941711426 mins Model: "sequential_3"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_5 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_6 (Bidirection | (None, | 200) | 560800 |
| dropout_3 (Dropout) | (None, | 200) | 0 |
| dense_3 (Dense) | (None, | 1) | 201 |

Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
```



Kappa Score: 0.9681606637795384

-----Fold 4-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.8679554462432861 sec Time to train the word2vec model: 47.314122915267944 mins Model: "sequential_4"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_7 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_8 (Bidirection | (None, | 200) | 560800 |
| dropout_4 (Dropout) | (None, | 200) | 0 |
| dense_4 (Dense) | (None, | 1) | 201 |

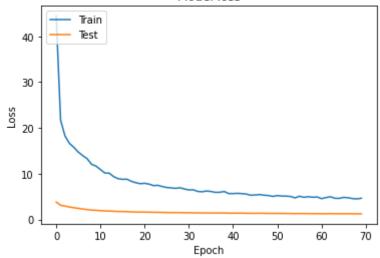
Total params: 2,243,401 Trainable params: 2,243,401 Non-trainable params: 0

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TPOCII 4//0
Epoch 5/70
Epoch 6/70
Epoch 7/70
Epoch 8/70
Epoch 9/70
Epoch 10/70
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Epoch 61/70
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| Epoch 62/70 | |
|-------------|--|
| 10381/10381 | [===================================== |
| Epoch 63/70 | |
| 10381/10381 | [=======] - 4s 341us/step - loss: 4.9610 - mae |
| Epoch 64/70 | |
| 10381/10381 | [=======] - 4s 338us/step - loss: 4.6316 - mae |
| Epoch 65/70 | |
| 10381/10381 | [===================================== |
| Epoch 66/70 | |
| 10381/10381 | [===================================== |
| Epoch 67/70 | |
| 10381/10381 | [=============] - 3s 322us/step - loss: 4.7419 - mae |
| Epoch 68/70 | |
| 10381/10381 | [============] - 3s 316us/step - loss: 4.5649 - mae |
| Epoch 69/70 | |
| 10381/10381 | [============] - 3s 324us/step - loss: 4.4909 - mae |
| Epoch 70/70 | |
| 10381/10381 | [===================================== |
| | |

Model loss



Kappa Score: 0.9725130742146156

-----Fold 5-----

Converting sentences to word2vec model

4 cores using

Time to build vocab using word2vec: 0.8937320709228516 sec Time to train the word2vec model: 48.75269365310669 mins Model: "sequential_5"

| Layer (type) | Output | Shape | Param # |
|------------------------------|--------|---------|---------|
| bidirectional_9 (Bidirection | (None, | 1, 600) | 1682400 |
| bidirectional_10 (Bidirectio | (None, | 200) | 560800 |
| dropout_5 (Dropout) | (None, | 200) | 0 |
| dense_5 (Dense) | (None, | | 201 |

Total params: 2,243,401 Trainable params: 2,243,401

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Epoch 3/70
Epoch 4/70
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Epoch 7/70
Epoch 8/70
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Epoch 62/70
Epoch 63/70
Epoch 64/70
Epoch 65/70
Epoch 66/70
Epoch 67/70
Epoch 68/70
Epoch 69/70
Epoch 70/70
```

Model loss 40 Train Test 0 10 0 10 20 30 40 50 60 70 Epoch

Kappa Score: 0.9569597144906096
Average kappa score value is : 0.9678135437377084

Double-click (or enter) to edit