Her göreve özel kullanılacak Simple Transformers modeli, kullanıcının modeli kendi kullanım durumlarına göre kolayca uyarlamasını sağlamak için tonlarca yapılandırma seçeneğiyle birlikte gelir. "https://simpletransformers.ai/docs/usage/"

!pip install simpletransformers

С→

Code snippets R X Want more memory and disk space? **Upgrade to Colab Pro** Not connected to runtime. Manage sessions Change runtime type

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```

Installing collected packages: tokenizers, huggingfac Successfully installed huggingface-hub-0.8.1 tokenize Installing collected packages: jedi, urllib3, smmap,

Gerekli kütüphane ve metrikler tanımlandı

```
UHITHSCALLING ULTILD3-1.24.3:
import numpy as np # linear algebra
import pandas as pd # data processing, CSV file I/O (e.g.
import tensorflow as tf
import torch
from sklearn.preprocessing import LabelEncoder
from transformers import BertTokenizer, AdamW , BertForSequ
from torch.utils.data import TensorDataset, random split,
from sklearn.model_selection import StratifiedKFold
from sklearn.metrics import balanced_accuracy_score, class
import datetime
import random
import seaborn as sns
import numpy as np
import time
import matplotlib.pyplot as plt
from sklearn.metrics import f1 score
from sklearn.metrics import recall_score
from sklearn.metrics import precision score
from sklearn.metrics import classification report
from sklearn.metrics import accuracy_score
```

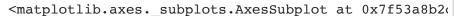
'dbmdz/bert-base-turkish-128k-uncased': vocab size -> 128k. The final training corpus has a size of 35GB and 44,04,976,662 tokens.

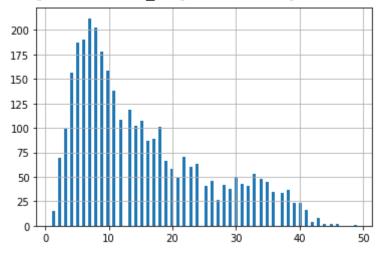
Temizlenmiş verinin kategorik etiketleri bir data frame e kaydedilip numerik olarak değiştirildi. Veri içeriğinde yer alan duplicate kayıtlar temizlendi .

```
# Dataset
df = pd.read_csv('/content/clean_data.csv')
df['label'] = LabelEncoder().fit_transform(df['label'])
df.drop_duplicates(subset='clean_data',inplace=True)
```

Kelime sayısı sağa çarpık . Dağılımın geneline uygun bir max length seçmek gerekirse 100 alabiliriz.

```
seq_len = [len(i.split()) for i in df["clean_data"]]
pd.Series(seq_len).hist(bins = 100) #kelime sayısı sağa ça
```





önceden eğitilmiş sınıflandırıcılar download edildi .

from simpletransformers.classification import Classificati
from sklearn.model_selection import KFold
from transformers import logging
logging.set_verbosity_error()

tokenizer = BertTokenizer.from_pretrained('dbmdz/bert-base
model = BertForSequenceClassification.from_pretrained('dbm
https://simpletransformers.ai/docs/classification-specif

GPU kullanıyor mu? Memory size nedir?

!nvidia-smi

Fri Aug 19 18:00:10 2022

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```
# check GPU
device_name = tf.test.gpu_device_name()
if device_name == '/device:GPU:0':
    device = torch.device("cuda") #Current GPU;tensörleri
else:
    raise SystemError('GPU device not found')
```

clean datadaki her satır için encode edilmiş değerleri hesaplar. input_ids ->verilen token pozisyonunun gerçek token içerip içermediğini veya sıfır dolgulu bir konum olup olmadığını gösterir. attention_mask yığındaki örneklerin uzunlukları farklı olsa bile, transformatöre bir yığın göndermemize olanak tanır.

O'ları dolgu jetonlarının konumlarına ve 1'leri gerçek jetonların konumlarına yerleştirerek hengi input_ids lerin dummy olduğunu belirler.

max_length=10 olsun . [101, 2026, 2171, 2003, 11754, 102, 0, 0, 0, 0], 101:[CLS]ve 102:[SEP] olduğu ifadeye karşılık gelir.

encode_plus-> encode-dan farkı tokenizer ve kelimeleri kullanarak bir string-i, bir dizi id e çevirir, modelin iki diziyi ayırt etmesine izin veren bir tür maskeleme bekler

```
input ids = []
attention masks = []
max len = 100
for text in df['clean_data']:
    encoded dict = tokenizer.encode plus(
                        str(text),
                        add_special_tokens = True,
                        max length = max len,
                        pad to max length = True,
                        return attention mask = True,
                        return tensors = 'pt',
                   )
    input ids.append(encoded dict['input ids'])
    attention masks.append(encoded dict['attention mask'])
input_ids = torch.cat(input_ids, dim=0)#Verilen boyutta(0)
attention masks = torch.cat(attention masks, dim=0)
```

```
print('Original: ', df['clean_data'][0])
print('Token IDs:', input_ids[0])
    /usr/local/lib/python3.7/dist-packages/transformers/
     FutureWarning,
    Original:
              alti kendine erkegim demesin diyen kasa
    Token IDs: tensor([ 2, 47106, 4852, 55711, 9534
                   0,
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```

Stratified K fold kullanılarak farklı etiketlerin verideki dağılımları dikkate alınmış oldu, veri seti 10 a bölündü . Veri artık input_ids ve labels isimli tensörlerden oluşmakta. Tensör nesneleri ile oluşan data frame sınıflandırıcıya verildi.

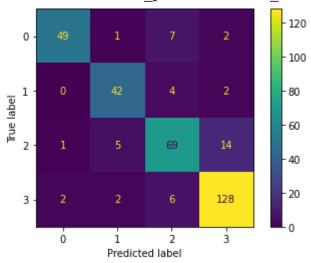
```
skf = StratifiedKFold(n splits=10)
results = []
train_data = pd.DataFrame(columns=['texts','labels'])
train data['texts'] = df.clean data
train data['labels'] = df.label
for train index, val index in skf.split(train data['texts'
 # splitting Dataframe (dataset not included)
   train df = train data.iloc[train index]
   val df = train data.iloc[val index]
   # Defining Model
   model = ClassificationModel('bert', 'dbmdz/bert-base-t
                                args={'reprocess_input_dat
                                      'num_train_epochs':
                                      "output dir": "bert
                                      "load best model at
                                     "max length": 30, "to
 # train the model
   model.train model(train df)
 # validate the model
   result, model_outputs, wrong_predictions = model.eval
   print(f'Acc : {result["acc"]}')
 # append model score
    results.append(result["acc"])
print("results", results)
print(f"Mean-Precision: {sum(results) / len(results)}")
```

```
/usr/local/lib/python3.7/dist-packages/simpletransform
  "Dataframe headers not specified. Falling back to 1
/usr/local/lib/python3.7/dist-packages/transformers/
 FutureWarning,
/usr/local/lib/python3.7/dist-packages/torch/optim/li
  "https://pytorch.org/docs/stable/optim.html#how-to-
/usr/local/lib/python3.7/dist-packages/simpletransform
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Acc: 0.7850746268656716
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Acc: 0.9101796407185628
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/usr/local/lib/python3.7/dist-packages/simpletransfor
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 FutureWarning,
/usr/local/lib/python3.7/dist-packages/torch/optim/li
  "https://pytorch.org/docs/stable/optim.html#how-to-
```

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    Acc: 0.8592814371257484
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      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
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    Acc: 0.8053892215568862
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    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
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    /usr/local/lib/python3.7/dist-packages/simpletransform
      "Dataframe headers not specified. Falling back to I
    Acc: 0.8832335329341318
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to I
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
      "Dataframe headers not specified. Falling back to 1
    Acc: 0.8622754491017964
    results [0.7850746268656716, 0.9343283582089552, 0.8]
    Mean-Precision: 0.8620967021181517
#model.get_named_parameters()
predictions = model outputs.argmax(axis=1)
actuals = val df.labels.values
print(classification report(actuals, predictions, digits=3
print(balanced accuracy score(actuals, predictions))
cm = confusion matrix(actuals, predictions, labels=[0,1,2]
print(cm)
tn, fp, fn, tp = cm
print((tn, fp, fn, tp))
                   precision
                                recall f1-score
                                                   support
               0
                       0.942
                                 0.831
                                           0.883
                                                         5!
               1
                       0.840
                                 0.875
                                                         41
                                           0.857
               2
                       0.802
                                 0.775
                                           0.789
                                                        8
                       0.877
                                 0.928
                                           0.901
                                                       138
```

```
accuracy
                                            0.862
                                                         334
                       0.865
                                  0.852
                                            0.858
                                                         334
       macro avg
    weighted avg
                       0.863
                                  0.862
                                            0.862
                                                         334
    0.8520814013341834
    [[ 49
             1
                 7
                     2]
     [
        0
            42
                 4
                     2]
                69 14]
     ſ
        1
             5
             2
                6 128]]
        2
    (array([49, 1, 7,
                         2]), array([ 0, 42, 4, 2]), as
disp = ConfusionMatrixDisplay(confusion_matrix=cm,
                               display_labels=[0,1,2,3])
disp.plot()
```

<sklearn.metrics._plot.confusion_matrix.ConfusionMati</pre>



Double-click (or enter) to edit

```
skf = StratifiedKFold(n_splits=10)
results = []
train data = pd.DataFrame(columns=['texts','labels'])
train_data['texts'] = df.clean_data
train data['labels'] = df.label
for train index, val index in skf.split(train data['texts'
 # splitting Dataframe (dataset not included)
   train_df = train_data.iloc[train_index]
   val df = train data.iloc[val index]
   # Defining Model
   model = ClassificationModel('bert', 'dbmdz/bert-base-t
                                args={ 'reprocess input dat
                                       'num train epochs':
                                       "output_dir": "bert_
                                      "load best model at
                                      "max_length": 100, "t
 # train the model
   model.train_model(train_df)
 # validate the model
```

```
result, model_outputs, wrong_predictions = model.eval_
   print(f'Acc : {result["acc"]}')
  # append model score
   results.append(result["acc"])
print("results",results)
print(f"Mean-Precision: {sum(results) / len(results)}")
```

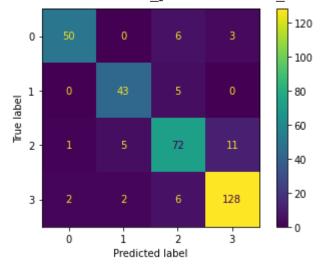
```
"Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to 1
    Acc: 0.7940298507462686
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
      "Dataframe headers not specified. Falling back to I
    Acc: 0.9343283582089552
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to I
    /usr/local/lib/python3.7/dist-packages/transformers/c
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to I
    Acc: 0.9402985074626866
    /usr/local/lib/python3.7/dist-packages/simpletransfor
       "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to 1
    Acc: 0.8952095808383234
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to 1
    Acc: 0.8892215568862275
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/nvthon3.7/dist_packages/transformers/
predictions = model outputs.argmax(axis=1)
actuals = val df.labels.values
print(classification report(actuals, predictions, digits=
print(balanced accuracy score(actuals, predictions))
cm = confusion matrix(actuals, predictions, labels=[0,1,2,
print(cm)
tn, fp, fn, tp = cm
print((tn, fp, fn, tp))
disp = ConfusionMatrixDisplay(confusion matrix=cm,
                              display labels=[0,1,2,3])
```

/usr/local/lib/python3.7/dist-packages/simpletransform

	precision	recall	f1-score	suppor
0	0.943	0.847	0.893	5!
1	0.860	0.896	0.878	41
2	0.809	0.809	0.809	8!
3	0.901	0.928	0.914	138
accuracy			0.877	334
macro avg	0.878	0.870	0.873	334
weighted avg	0.878	0.877	0.877	334

0.8699539890952449

(array([50, 0, 6, 3]), array([0, 43, 5, 0]), at <sklearn.metrics.plot.confusion_matrix.ConfusionMatrix</pre>



```
skf = StratifiedKFold(n_splits=10)
results = []
train_data = pd.DataFrame(columns=['texts','labels'])
train_data['texts'] = df.clean_data
train data['labels'] = df.label
for train index, val index in skf.split(train data['texts'
 # splitting Dataframe (dataset not included)
    train_df = train_data.iloc[train_index]
   val df = train data.iloc[val index]
   # Defining Model
   model = ClassificationModel('bert', 'dbmdz/bert-base-t
                                args={ 'reprocess input dat
                                       'num train epochs':
                                 ....."output_dir": "bert_
                                       "load_best_model_at_
                                     "max_length": 100, "t
 # train the model
   model.train_model(train_df)
```

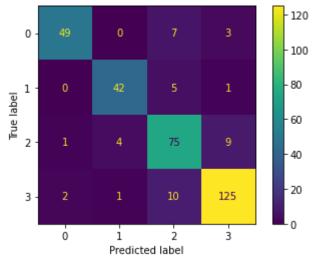
```
# validate the model
   result, model_outputs, wrong_predictions = model.eval_
   print(f'Acc : {result["acc"]}')
  # append model score
   results.append(result["acc"])
print("results",results)
print(f"Mean-Precision: {sum(results) / len(results)}")
```

```
/usr/local/lib/python3.7/dist-packages/simpletransform
      "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to 1
    Acc: 0.7970149253731343
    /usr/local/lib/python3.7/dist-packages/simpletransfo
      "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
      "Dataframe headers not specified. Falling back to I
    Acc: 0.9223880597014925
    /usr/local/lib/python3.7/dist-packages/simpletransfor
      "Dataframe headers not specified. Falling back to I
    /usr/local/lib/python3.7/dist-packages/transformers/c
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
      "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransfol
       "Dataframe headers not specified. Falling back to I
    Acc: 0.9373134328358209
    /usr/local/lib/python3.7/dist-packages/simpletransfol
      "Dataframe headers not specified. Falling back to I
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
       "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to I
    Acc: 0.9191616766467066
    /usr/local/lib/python3.7/dist-packages/simpletransfor
       "Dataframe headers not specified. Falling back to I
    /usr/local/lib/python3.7/dist-packages/transformers/
      FutureWarning,
    /usr/local/lib/python3.7/dist-packages/torch/optim/li
      "https://pytorch.org/docs/stable/optim.html#how-to-
    /usr/local/lib/python3.7/dist-packages/simpletransform
       "Dataframe headers not specified. Falling back to I
    Acc: 0.8892215568862275
    /usr/local/lib/python3.7/dist-packages/simpletransfor
       "Dataframe headers not specified. Falling back to 1
    /usr/local/lib/python3.7/dist-packages/transformers/
predictions = model outputs.argmax(axis=1)
actuals = val df.labels.values
print(classification_report(actuals, predictions, digits=3
print(balanced_accuracy_score(actuals, predictions))
cm = confusion_matrix(actuals, predictions, labels=[0,1,2,
print(cm)
tn, fp, fn, tp = cm
print((tn, fp, fn, tp))
```

	precision	recall	f1-score	suppor
0	0.942	0.831	0.883	5!
1	0.894	0.875	0.884	41
2	0.773	0.843	0.806	8!
3	0.906	0.906	0.906	138
accuracy			0.871	334
macro avg	0.879	0.864	0.870	334
weighted avg	0.875	0.871	0.872	334
0.86350055130	97574			

```
[ 49 0 7 3]
[ 0 42 5 1]
[ 1 4 75 9]
[ 2 1 10 125]]
```

(array([49, 0, 7, 3]), array([0, 42, 5, 1]), as <sklearn.metrics._plot.confusion_matrix.ConfusionMatrix



Bir sonraki adım şöyle olabilirdi;

Multi-Label Classification Çok etiketli metin sınıflandırmasında, veri kümesinden tek bir örneğin hedefi, n farklı ikili etiketlerin bir listesidir. Bir transformatör tabanlı çok etiketli metin sınıflandırma modeli, tipik olarak, üzerinde bir sınıflandırma katmanı bulunan bir transformatör modelinden oluşur. Sınıflandırma katmanı, n sayıda her etikete karşılık gelen çıkış nöronlarına sahip olacaktır. Her çıktı nöronu (ve uzantı olarak, her etiket) birbirinden bağımsız olarak kabul edilir.

https://simpletransformers.ai/docs/multi-label-classification/

BERT modelinde parametre sayısı nasıl hesaplanır?

