Base BERT Disaster Tweets

May 16, 2022

[]: !pip install datasets

```
!pip install transformers
Requirement already satisfied: datasets in /usr/local/lib/python3.7/dist-
packages (2.2.1)
Requirement already satisfied: xxhash in /usr/local/lib/python3.7/dist-packages
(from datasets) (3.0.0)
Requirement already satisfied: fsspec[http]>=2021.05.0 in
/usr/local/lib/python3.7/dist-packages (from datasets) (2022.3.0)
Requirement already satisfied: requests>=2.19.0 in
/usr/local/lib/python3.7/dist-packages (from datasets) (2.23.0)
Requirement already satisfied: pyarrow>=6.0.0 in /usr/local/lib/python3.7/dist-
packages (from datasets) (6.0.1)
Requirement already satisfied: dill in /usr/local/lib/python3.7/dist-packages
(from datasets) (0.3.4)
Requirement already satisfied: responses<0.19 in /usr/local/lib/python3.7/dist-
packages (from datasets) (0.18.0)
Requirement already satisfied: tqdm>=4.62.1 in /usr/local/lib/python3.7/dist-
packages (from datasets) (4.64.0)
Requirement already satisfied: multiprocess in /usr/local/lib/python3.7/dist-
packages (from datasets) (0.70.12.2)
Requirement already satisfied: huggingface-hub<1.0.0,>=0.1.0 in
/usr/local/lib/python3.7/dist-packages (from datasets) (0.6.0)
Requirement already satisfied: pandas in /usr/local/lib/python3.7/dist-packages
(from datasets) (1.3.5)
Requirement already satisfied: importlib-metadata in
/usr/local/lib/python3.7/dist-packages (from datasets) (4.11.3)
Requirement already satisfied: packaging in /usr/local/lib/python3.7/dist-
packages (from datasets) (21.3)
Requirement already satisfied: numpy>=1.17 in /usr/local/lib/python3.7/dist-
packages (from datasets) (1.21.6)
Requirement already satisfied: aiohttp in /usr/local/lib/python3.7/dist-packages
(from datasets) (3.8.1)
Requirement already satisfied: pyyaml in /usr/local/lib/python3.7/dist-packages
(from huggingface-hub<1.0.0,>=0.1.0->datasets) (6.0)
Requirement already satisfied: filelock in /usr/local/lib/python3.7/dist-
packages (from huggingface-hub<1.0.0,>=0.1.0->datasets) (3.6.0)
Requirement already satisfied: typing-extensions>=3.7.4.3 in
```

```
/usr/local/lib/python3.7/dist-packages (from huggingface-
hub<1.0.0,>=0.1.0->datasets) (4.2.0)
Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in
/usr/local/lib/python3.7/dist-packages (from packaging->datasets) (3.0.8)
Requirement already satisfied: urllib3!=1.25.0,!=1.25.1,<1.26,>=1.21.1 in
/usr/local/lib/python3.7/dist-packages (from requests>=2.19.0->datasets)
Requirement already satisfied: idna<3,>=2.5 in /usr/local/lib/python3.7/dist-
packages (from requests>=2.19.0->datasets) (2.10)
Requirement already satisfied: certifi>=2017.4.17 in
/usr/local/lib/python3.7/dist-packages (from requests>=2.19.0->datasets)
(2021.10.8)
Requirement already satisfied: chardet<4,>=3.0.2 in
/usr/local/lib/python3.7/dist-packages (from requests>=2.19.0->datasets) (3.0.4)
Requirement already satisfied: multidict<7.0,>=4.5 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (6.0.2)
Requirement already satisfied: async-timeout<5.0,>=4.0.0a3 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (4.0.2)
Requirement already satisfied: aiosignal>=1.1.2 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (1.2.0)
Requirement already satisfied: asynctest==0.13.0 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (0.13.0)
Requirement already satisfied: frozenlist>=1.1.1 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (1.3.0)
Requirement already satisfied: attrs>=17.3.0 in /usr/local/lib/python3.7/dist-
packages (from aiohttp->datasets) (21.4.0)
Requirement already satisfied: yarl<2.0,>=1.0 in /usr/local/lib/python3.7/dist-
packages (from aiohttp->datasets) (1.7.2)
Requirement already satisfied: charset-normalizer<3.0,>=2.0 in
/usr/local/lib/python3.7/dist-packages (from aiohttp->datasets) (2.0.12)
Requirement already satisfied: zipp>=0.5 in /usr/local/lib/python3.7/dist-
packages (from importlib-metadata->datasets) (3.8.0)
Requirement already satisfied: pytz>=2017.3 in /usr/local/lib/python3.7/dist-
packages (from pandas->datasets) (2022.1)
Requirement already satisfied: python-dateutil>=2.7.3 in
/usr/local/lib/python3.7/dist-packages (from pandas->datasets) (2.8.2)
Requirement already satisfied: six>=1.5 in /usr/local/lib/python3.7/dist-
packages (from python-dateutil>=2.7.3->pandas->datasets) (1.15.0)
Requirement already satisfied: transformers in /usr/local/lib/python3.7/dist-
packages (4.19.1)
Requirement already satisfied: importlib-metadata in
/usr/local/lib/python3.7/dist-packages (from transformers) (4.11.3)
Requirement already satisfied: tqdm>=4.27 in /usr/local/lib/python3.7/dist-
packages (from transformers) (4.64.0)
Requirement already satisfied: numpy>=1.17 in /usr/local/lib/python3.7/dist-
packages (from transformers) (1.21.6)
Requirement already satisfied: regex!=2019.12.17 in
/usr/local/lib/python3.7/dist-packages (from transformers) (2019.12.20)
```

```
Requirement already satisfied: requests in /usr/local/lib/python3.7/dist-
packages (from transformers) (2.23.0)
Requirement already satisfied: tokenizers!=0.11.3,<0.13,>=0.11.1 in
/usr/local/lib/python3.7/dist-packages (from transformers) (0.12.1)
Requirement already satisfied: huggingface-hub<1.0,>=0.1.0 in
/usr/local/lib/python3.7/dist-packages (from transformers) (0.6.0)
Requirement already satisfied: pyyaml>=5.1 in /usr/local/lib/python3.7/dist-
packages (from transformers) (6.0)
Requirement already satisfied: packaging>=20.0 in /usr/local/lib/python3.7/dist-
packages (from transformers) (21.3)
Requirement already satisfied: filelock in /usr/local/lib/python3.7/dist-
packages (from transformers) (3.6.0)
Requirement already satisfied: typing-extensions>=3.7.4.3 in
/usr/local/lib/python3.7/dist-packages (from huggingface-
hub<1.0,>=0.1.0->transformers) (4.2.0)
Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in
/usr/local/lib/python3.7/dist-packages (from packaging>=20.0->transformers)
Requirement already satisfied: zipp>=0.5 in /usr/local/lib/python3.7/dist-
packages (from importlib-metadata->transformers) (3.8.0)
Requirement already satisfied: chardet<4,>=3.0.2 in
/usr/local/lib/python3.7/dist-packages (from requests->transformers) (3.0.4)
Requirement already satisfied: idna<3,>=2.5 in /usr/local/lib/python3.7/dist-
packages (from requests->transformers) (2.10)
Requirement already satisfied: urllib3!=1.25.0,!=1.25.1,<1.26,>=1.21.1 in
/usr/local/lib/python3.7/dist-packages (from requests->transformers) (1.25.11)
Requirement already satisfied: certifi>=2017.4.17 in
/usr/local/lib/python3.7/dist-packages (from requests->transformers) (2021.10.8)
```

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

Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force_remount=True).

```
[]: import pandas as pd
  import numpy as np
  import torch
  from torch import cuda
  import random
  import os
  import torch
  from torch import nn
  from transformers import Trainer
  from collections import Counter
  from sklearn.model_selection import train_test_split
  from sklearn.metrics import f1_score, classification_report
  from sklearn.utils.class_weight import compute_class_weight
```

```
import datasets
     from datasets import Dataset, load_metric
     import transformers
     from transformers import AutoTokenizer
     from transformers import AutoModelForSequenceClassification, TrainingArguments, u
      →Trainer, DataCollatorWithPadding
     print(torch.__version__)
     print(transformers.__version__)
    1.11.0+cu113
    4.19.1
[]: cd /content/drive/MyDrive/Colab Notebooks
    /content/drive/MyDrive/Colab Notebooks
[]: train_path = './nlp-getting-started/train.csv'
     train_data = pd.read_csv(train_path)
     train_data = train_data[['text', 'target']]
     train_data.rename(columns={"target": "label"}, inplace=True)
     test_path = './nlp-getting-started/train.csv'
     test_data = pd.read_csv(test_path)
     test_data = test_data[['text']]
     test_data.rename(columns={"target": "label"}, inplace=True)
[]: train_data, dev_data = train_test_split(train_data, test_size=0.1,_
      ⇔shuffle=True, stratify=train_data['label'])
     print("Train dataset labels count = ", Counter(train_data['label']))
     print("Dev dataset labels count = ", Counter(dev_data['label']))
     #print("Test dataset labels count = ", Counter(test_data['target'])) #test_
      ⇔dataset does not contain the target label
    Train dataset labels count = Counter({0: 3907, 1: 2944})
    Dev dataset labels count = Counter({0: 435, 1: 327})
[]: model_checkpoint = 'bert-base-uncased'
     tokenizer = AutoTokenizer.from_pretrained(model_checkpoint, use_fast=False)
     model = AutoModelForSequenceClassification.from_pretrained(model_checkpoint,_

¬num_labels=2).to('cuda')

    loading configuration file https://huggingface.co/bert-base-
    uncased/resolve/main/config.json from cache at /root/.cache/huggingface/transfor
    mers/3c61d016573b14f7f008c02c4e51a366c67ab274726fe2910691e2a761acf43e.37395cee44
    2ab11005bcd270f3c34464dc1704b715b5d7d52b1a461abe3b9e4e
    Model config BertConfig {
      "_name_or_path": "bert-base-uncased",
```

```
"architectures": [
    "BertForMaskedLM"
  ],
  "attention_probs_dropout_prob": 0.1,
  "classifier dropout": null,
  "gradient checkpointing": false,
  "hidden act": "gelu",
  "hidden dropout prob": 0.1,
  "hidden size": 768,
  "initializer_range": 0.02,
  "intermediate_size": 3072,
  "layer_norm_eps": 1e-12,
  "max_position_embeddings": 512,
  "model_type": "bert",
  "num_attention_heads": 12,
  "num_hidden_layers": 12,
  "pad_token_id": 0,
  "position_embedding_type": "absolute",
  "transformers_version": "4.19.1",
  "type vocab size": 2,
  "use cache": true,
  "vocab_size": 30522
}
loading file https://huggingface.co/bert-base-uncased/resolve/main/vocab.txt
from cache at /root/.cache/huggingface/transformers/45c3f7a79a80e1cf0a489e5c62b4
3f173c15db47864303a55d623bb3c96f72a5.d789d64ebfe299b0e416afc4a169632f903f693095b
4629a7ea271d5a0cf2c99
loading file https://huggingface.co/bert-base-
uncased/resolve/main/added_tokens.json from cache at None
loading file https://huggingface.co/bert-base-
uncased/resolve/main/special_tokens_map.json from cache at None
loading file https://huggingface.co/bert-base-
uncased/resolve/main/tokenizer_config.json from cache at /root/.cache/huggingfac
e/transformers/c1d7f0a763fb63861cc08553866f1fc3e5a6f4f07621be277452d26d71303b7e.
20430bd8e10ef77a7d2977accefe796051e01bc2fc4aa146bc862997a1a15e79
loading configuration file https://huggingface.co/bert-base-
uncased/resolve/main/config.json from cache at /root/.cache/huggingface/transfor
mers/3c61d016573b14f7f008c02c4e51a366c67ab274726fe2910691e2a761acf43e.37395cee44
2ab11005bcd270f3c34464dc1704b715b5d7d52b1a461abe3b9e4e
Model config BertConfig {
  "_name_or_path": "bert-base-uncased",
  "architectures": [
    "BertForMaskedLM"
  ],
  "attention_probs_dropout_prob": 0.1,
  "classifier_dropout": null,
  "gradient_checkpointing": false,
```

```
"hidden_act": "gelu",
  "hidden_dropout_prob": 0.1,
  "hidden_size": 768,
  "initializer_range": 0.02,
  "intermediate size": 3072,
  "layer_norm_eps": 1e-12,
  "max position embeddings": 512,
  "model_type": "bert",
  "num attention heads": 12,
  "num_hidden_layers": 12,
  "pad_token_id": 0,
  "position_embedding_type": "absolute",
  "transformers_version": "4.19.1",
  "type_vocab_size": 2,
  "use_cache": true,
  "vocab_size": 30522
}
loading configuration file https://huggingface.co/bert-base-
uncased/resolve/main/config.json from cache at /root/.cache/huggingface/transfor
mers/3c61d016573b14f7f008c02c4e51a366c67ab274726fe2910691e2a761acf43e.37395cee44
2ab11005bcd270f3c34464dc1704b715b5d7d52b1a461abe3b9e4e
Model config BertConfig {
  "_name_or_path": "bert-base-uncased",
  "architectures": [
    "BertForMaskedLM"
  ],
  "attention_probs_dropout_prob": 0.1,
  "classifier dropout": null,
  "gradient_checkpointing": false,
  "hidden_act": "gelu",
  "hidden_dropout_prob": 0.1,
  "hidden_size": 768,
  "initializer_range": 0.02,
  "intermediate size": 3072,
  "layer norm eps": 1e-12,
  "max position embeddings": 512,
  "model_type": "bert",
  "num_attention_heads": 12,
  "num_hidden_layers": 12,
  "pad_token_id": 0,
  "position_embedding_type": "absolute",
  "transformers_version": "4.19.1",
  "type_vocab_size": 2,
  "use_cache": true,
  "vocab size": 30522
}
```

```
loading weights file https://huggingface.co/bert-base-
    uncased/resolve/main/pytorch_model.bin from cache at /root/.cache/huggingface/tr
    ansformers/a8041bf617d7f94ea26d15e218abd04afc2004805632abc0ed2066aa16d50d04.faf6
    ea826ae9c5867d12b22257f9877e6b8367890837bd60f7c54a29633f7f2f
    Some weights of the model checkpoint at bert-base-uncased were not used when
    initializing BertForSequenceClassification: ['cls.seq_relationship.bias',
    'cls.predictions.transform.dense.bias',
    'cls.predictions.transform.LayerNorm.bias', 'cls.seq_relationship.weight',
    'cls.predictions.transform.LayerNorm.weight', 'cls.predictions.decoder.weight',
    'cls.predictions.transform.dense.weight', 'cls.predictions.bias']
    - This IS expected if you are initializing BertForSequenceClassification from
    the checkpoint of a model trained on another task or with another architecture
    (e.g. initializing a BertForSequenceClassification model from a
    BertForPreTraining model).
    - This IS NOT expected if you are initializing BertForSequenceClassification
    from the checkpoint of a model that you expect to be exactly identical
    (initializing a BertForSequenceClassification model from a
    BertForSequenceClassification model).
    Some weights of BertForSequenceClassification were not initialized from the
    model checkpoint at bert-base-uncased and are newly initialized:
    ['classifier.bias', 'classifier.weight']
    You should probably TRAIN this model on a down-stream task to be able to use it
    for predictions and inference.
[]: def preprocess_function(examples):
        return tokenizer(examples['text'], truncation=True)
[]: train_data = Dataset.from_pandas(train_data)
     dev_data = Dataset.from_pandas(dev_data)
     test_data = Dataset.from_pandas(test_data)
     encoded_dataset_train = train_data.map(preprocess_function, batched=True)
     encoded_dataset_dev = dev_data.map(preprocess_function, batched=True)
     encoded_dataset_test = test_data.map(preprocess_function, batched=True)
                   | 0/7 [00:00<?, ?ba/s]
      0%1
      0%1
                   | 0/1 [00:00<?, ?ba/s]
      0%1
                   | 0/8 [00:00<?, ?ba/s]
[]: columns_to_return = ['input_ids', 'label', 'attention_mask']
     columns_to_return_test = ['input_ids', 'attention_mask']
     encoded_dataset_train.set_format(columns=columns_to_return)
     encoded_dataset_dev.set_format(columns=columns_to_return)
     encoded_dataset_test.set_format(columns=columns_to_return_test)
[]: batch_size = 8
     metric_name = "f1"
```

```
model_name = model_checkpoint.split("/")[-1]
task = 'tweet'

args = TrainingArguments(
    f"./save_model/{model_name}-finetuned-{task}",
    evaluation_strategy = "epoch",
    save_strategy = "epoch",
    learning_rate=1e-5,
    per_device_train_batch_size=batch_size,
    per_device_eval_batch_size=batch_size,
    num_train_epochs=4,
    weight_decay=0.01,
    load_best_model_at_end=True,
    metric_for_best_model=metric_name,
    push_to_hub=False,
)
```

PyTorch: setting up devices

The default value for the training argument `--report_to` will change in v5 (from all installed integrations to none). In v5, you will need to use `--report_to all` to get the same behavior as now. You should start updating your code and make this info disappear :-).

```
[]: trainer = Trainer(
    model,
    args,
    train_dataset=encoded_dataset_train,
    eval_dataset=encoded_dataset_dev,
    tokenizer=tokenizer,
    compute_metrics=compute_metrics
)
```

```
[]: trainer.train()
```

The following columns in the training set don't have a corresponding argument in `BertForSequenceClassification.forward` and have been ignored: text, __index_level_0_. If text, __index_level_0_ are not expected by `BertForSequenceClassification.forward`, you can safely ignore this message. /usr/local/lib/python3.7/dist-packages/transformers/optimization.py:309: FutureWarning: This implementation of AdamW is deprecated and will be removed in a future version. Use the PyTorch implementation torch.optim.AdamW instead, or

```
set `no_deprecation_warning=True` to disable this warning
 FutureWarning,
***** Running training ****
 Num examples = 6851
 Num Epochs = 4
 Instantaneous batch size per device = 8
 Total train batch size (w. parallel, distributed & accumulation) = 8
 Gradient Accumulation steps = 1
 Total optimization steps = 3428
<IPython.core.display.HTML object>
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
__index_level_0__. If text, __index_level_0__ are not expected by
`BertForSequenceClassification.forward`, you can safely ignore this message.
**** Running Evaluation ****
 Num examples = 762
 Batch size = 8
Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857
Configuration saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/config.json
Model weights saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/pytorch_model.bin
tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/tokenizer_config.json
Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/special_tokens_map.json
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
__index_level_0__. If text, __index_level_0__ are not expected by
`BertForSequenceClassification.forward`, you can safely ignore this message.
**** Running Evaluation ****
 Num examples = 762
 Batch size = 8
Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714
Configuration saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/config.json
Model weights saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/pytorch_model.bin
tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/tokenizer_config.json
Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/special_tokens_map.json
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
__index_level_0__. If text, __index_level_0__ are not expected by
```

```
`BertForSequenceClassification.forward`, you can safely ignore this message.
    ***** Running Evaluation *****
      Num examples = 762
      Batch size = 8
    Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571
    Configuration saved in ./save model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571/config.json
    Model weights saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571/pytorch_model.bin
    tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571/tokenizer_config.json
    Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571/special_tokens_map.json
    The following columns in the evaluation set don't have a corresponding argument
    in `BertForSequenceClassification.forward` and have been ignored: text,
    __index_level_0__. If text, __index_level_0__ are not expected by
    `BertForSequenceClassification.forward`, you can safely ignore this message.
    ***** Running Evaluation *****
      Num examples = 762
      Batch size = 8
    Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428
    Configuration saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/config.json
    Model weights saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/pytorch_model.bin
    tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/tokenizer_config.json
    Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/special_tokens_map.json
    Training completed. Do not forget to share your model on huggingface.co/models
    =)
    Loading best model from ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-1714 (score: 0.8339883748289776).
[]: TrainOutput(global_step=3428, training_loss=0.3453334421093294,
    metrics={'train_runtime': 437.0492, 'train_samples_per_second': 62.702,
     'train_steps_per_second': 7.844, 'total_flos': 709032391428420.0, 'train_loss':
     0.3453334421093294, 'epoch': 4.0})
[]: #get test predictions
     predictions = trainer.predict(encoded_dataset_test)
```

```
preds = np.argmax(predictions.predictions, axis=-1)
#print the top 100 examples
for i in range(100):
    print(encoded_dataset_test['text'][i], preds[i], sep='\t')
The following columns in the test set don't have a corresponding argument in
`BertForSequenceClassification.forward` and have been ignored: text. If text are
not expected by `BertForSequenceClassification.forward`, you can safely ignore
this message.
***** Running Prediction *****
  Num examples = 7613
 Batch size = 8
<IPython.core.display.HTML object>
Our Deeds are the Reason of this #earthquake May ALLAH Forgive us all
Forest fire near La Ronge Sask. Canada 1
All residents asked to 'shelter in place' are being notified by officers. No
other evacuation or shelter in place orders are expected
13,000 people receive #wildfires evacuation orders in California
Just got sent this photo from Ruby #Alaska as smoke from #wildfires pours into a
school
#RockyFire Update => California Hwy. 20 closed in both directions due to Lake
County fire - #CAfire #wildfires 1
#flood #disaster Heavy rain causes flash flooding of streets in Manitou,
Colorado Springs areas 1
I'm on top of the hill and I can see a fire in the woods...
There's an emergency evacuation happening now in the building across the street
I'm afraid that the tornado is coming to our area...
Three people died from the heat wave so far
Haha South Tampa is getting flooded hah- WAIT A SECOND I LIVE IN SOUTH TAMPA
WHAT AM I GONNA DO WHAT AM I GONNA DO FVCK #flooding
#raining #flooding #Florida #TampaBay #Tampa 18 or 19 days. I've lost count
#Flood in Bago Myanmar #We arrived Bago 1
Damage to school bus on 80 in multi car crash #BREAKING
                                                                1
What's up man?
I love fruits
Summer is lovely
                        0
My car is so fast
What a goooooooaaaaaal!!!!!!
this is ridiculous... 0
London is cool;)
Love skiing
What a wonderful day!
L000000L
No way...I can't eat that shit 0
Was in NYC last week!
```

```
Love my girlfriend
Cooool :)
Do you like pasta?
                        0
The end!
@bbcmtd Wholesale Markets ablaze http://t.co/lHYXEOHY6C 1
We always try to bring the heavy. #metal #RT http://t.co/YAo1e0xngw
#AFRICANBAZE: Breaking news: Nigeria flag set ablaze in Aba.
http://t.co/2nndBGwyEi
Crying out for more! Set me ablaze
On plus side LOOK AT THE SKY LAST NIGHT IT WAS ABLAZE http://t.co/qqsmshaJ3N
@PhDSquares #mufc they've built so much hype around new acquisitions but I doubt
they will set the EPL ablaze this season.
INEC Office in Abia Set Ablaze - http://t.co/3ImaomknnA 1
Barbados #Bridgetown JAMAICA ÛÒ Two cars set ablaze: SANTA CRUZ ÛÓ Head of the
St Elizabeth Police Superintende... http://t.co/wDUEaj8Q4J
Ablaze for you Lord :D 0
Check these out: http://t.co/rOI2NSmEJJ http://t.co/3Tj8ZjiN21
http://t.co/YDUiXEfIpE http://t.co/LxTjc87KLS #nsfw
on the outside you're ablaze and alive
but you're dead inside 0
Had an awesome time visiting the CFC head office the ancop site and ablaze.
Thanks to Tita Vida for taking care of us ??
SOOOO PUMPED FOR ABLAZE ???? @southridgelife
I wanted to set Chicago ablaze with my preaching... But not my hotel!
http://t.co/o9qknbf0FX
I gained 3 followers in the last week. You? Know your stats and grow with
http://t.co/TIyUliF5c6
                              0
How the West was burned: Thousands of wildfires ablaze in California alone
http://t.co/v15TBR3wbr
Building the perfect tracklist to life leave the streets ablaze 0
Check these out: http://t.co/rOI2NSmEJJ http://t.co/3Tj8ZjiN21
http://t.co/YDUiXEfIpE http://t.co/LxTjc87KLS #nsfw
First night with retainers in. It's quite weird. Better get used to it; I have
to wear them every single night for the next year at least.
Deputies: Man shot before Brighton home set ablaze http://t.co/gWNRhMSO8k
Man wife get six years jail for setting ablaze niece
http://t.co/eV1ahOUCZA 1
SANTA CRUZ ÛÓ Head of the St Elizabeth Police Superintendent Lanford Salmon has
r ... - http://t.co/vplR5Hka2u http://t.co/SxHW2TNNLf 0
Police: Arsonist Deliberately Set Black Church In North CarolinaåÊAblaze
http://t.co/pcXarbH9An 1
Noches El-Bestia '@Alexis Sanchez: happy to see my teammates and training hard
?? goodnight gunners.????? http://t.co/uc4j4jHvGR'
#Kurds trampling on Turkmen flag later set it ablaze while others vandalized
offices of Turkmen Front in #Diyala http://t.co/4IzFdYC3cg 1
TRUCK ABLAZE: R21. VOORTREKKER AVE. OUTSIDE OR TAMBO INTL. CARGO SECTION.
```

```
http://t.co/8kscqKfKkF
Set our hearts ablaze and every city was a gift And every skyline was like a
kiss upon the lips @ Û https://t.co/cYoMPZ1AOZ
They sky was ablaze tonight in Los Angeles. I'm expecting IG and FB to be filled
with sunset shots if I know my peeps!! 0
How the West was burned: Thousands of wildfires ablaze in #California alone
http://t.co/iCSjGZ9tE1 #climate #energy http://t.co/9FxmN010Bd
Revel in yours wmv videos by means of mac farewell ablaze wmv en route to dvd:
GtxRWm
Progressive greetings!
In about a month students would have set their pens ablaze in The Torch
Publications'... http://t.co/9FxPiXQuJt 0
Rene Ablaze & Darita - Secret 2k13 (Fallen Skies Edit) - Mar 30 2013
https://t.co/7MLMsUzV1Z
@Navista7 Steve these fires out here are something else! California is a
tinderbox - and this clown was setting my 'hood ablaze @News24680
#NowPlaying: Rene Ablaze & mp; Ian Buff - Magnitude http://t.co/Av2JSjfFtc #EDM
@nxwestmidlands huge fire at Wholesale markets ablaze http://t.co/rwzbFVNXER
@ablaze what time does your talk go until? I don't know if I can make it due to
'I can't have kids cuz I got in a bicycle accident & amp; split my testicles.
it's impossible for me to have kids' MICHAEL YOU ARE THE FATHER
Accident on I-24 W #NashvilleTraffic. Traffic moving 8m slower than usual.
https://t.co/0GHk693EgJ
Accident center lane blocked in #SantaClara on US-101 NB before Great America
Pkwy #BayArea #Traffic http://t.co/pml0hZuRWR
http://t.co/GKYe6gjTk5 Had a #personalinjury accident this summer? Read our
advice & see how a #solicitor can help #OtleyHour
#stlouis #caraccidentlawyer Speeding Among Top Causes of Teen Accidents
https://t.co/k4zoMOF319 https://t.co/S2kXVMOcBA Car Accident tee Û
Reported motor vehicle accident in Curry on Herman Rd near Stephenson involving
an overturned vehicle. Please use... http://t.co/YbJezKuRW1
BigRigRadio Live Accident Awareness
I-77 Mile Marker 31 South Mooresville Iredell Vehicle Accident Ramp Closed at
8/6 1:18 PM
RT @SleepJunkies: Sleeping pills double your risk of a car accident
http://t.co/7s9Nm1fiCT
'By accident' they knew what was gon happen https://t.co/Ysxun5vCeh
                                                                        0
Traffic accident N CABRILLO HWY/MAGELLAN AV MIR (08/06/15 11:03:58)
I-77 Mile Marker 31 to 40 South Mooresville Iredell Vehicle Accident Congestion
at 8/6 1:18 PM 1
the pastor was not in the scene of the accident...who was the owner of the
range rover ?
mom: 'we didn't get home as fast as we wished'
me: 'why is that?'
```

```
mom: 'there was an accident and some truck spilt mayonnaise all over ???????
I was in a horrible car accident this past Sunday. I'm finally able to get
around. Thank you GOD??
Can wait to see how pissed Donnie is when I tell him I was in ANOTHER accident??
#TruckCrash Overturns On #FortWorth Interstate http://t.co/Rs22LJ4qFp Click here
if you've been in a crash>http://t.co/LdOunIYw4k
Accident in #Ashville on US 23 SB before SR 752 #traffic http://t.co/hylMoOWgFI
Carolina accident: Motorcyclist Dies in I-540 Crash With Car That Crossed
Median: A motorcycle rider traveling... http://t.co/p18lzRlmy6
FYI CAD: FYI: ; ACCIDENT PROPERTY DAMAGE; NHS; 999 PINER RD/HORNDALE DR
RT nAAYf: First accident in years. Turning onto Chandanee Magu from near MMA.
Taxi rammed into me while I was halfway turned. Everyone conf \hat{U}_{-} 1
Accident left lane blocked in #Manchester on Rt 293 NB before Eddy Rd stop and
go traffic back to NH-3A delay of 4 mins #traffic
; ACCIDENT PROPERTY DAMAGE; PINER RD/HORNDALE DR 1
???? it was an accident http://t.co/Oia5fxi4gM 1
FYI CAD: FYI: ; ACCIDENT PROPERTY DAMAGE; WPD; 1600 S 17TH ST
8/6/2015@2:09 PM: TRAFFIC ACCIDENT NO INJURY at 2781 WILLIS FOREMAN RD
http://t.co/VCkIT6EDEv
Aashiqui Actress Anu Aggarwal On Her Near-Fatal Accident http://t.co/60tfp31LqW
Suffield Alberta Accident https://t.co/bPTmlF4P10
9 Mile backup on I-77 South...accident blocking the Right 2 Lanes at Exit 31
Langtree Rd...consider NC 115 or NC 150 to NC 16 as alternate
Has an accident changed your life? We will help you determine options that can
financially support life care plans and on-going treatment.
#BREAKING: there was a deadly motorcycle car accident that happened to
#Hagerstown today. I'll have more details at 5 @Your4State. #WHAG
Oflowri were you marinading it or was it an accident?
only had a car for not even a week and got in a fucking car accident .. Mfs
can't fucking drive .
```

0.0.1 Optional: custom class weight

[3907 2944] [0.87675966 1.16355299]

[]:

```
[]: class CustomTrainer(Trainer):
         def compute_loss(self, model, inputs, return_outputs=False):
             #print(inputs)
             labels = inputs.get("labels")
             # forward pass
             outputs = model(**inputs)
             logits = outputs.get("logits")
             # compute custom loss (suppose one has 2 labels with different weights)
             loss_fct = nn.CrossEntropyLoss(weight=torch.Tensor(class_weights).

sto('cuda'))
             loss = loss fct(logits.view(-1, self.model.config.num_labels), labels.
      \rightarrowview(-1))
             return (loss, outputs) if return_outputs else loss
[]: trainer = CustomTrainer(
         model,
         args,
         train_dataset=encoded_dataset_train,
         eval_dataset=encoded_dataset_dev,
         tokenizer=tokenizer,
         compute_metrics=compute_metrics
[]: trainer.train()
    The following columns in the training set don't have a corresponding argument in
    `BertForSequenceClassification.forward` and have been ignored: text,
    __index_level_0__. If text, __index_level_0__ are not expected by
    `BertForSequenceClassification.forward`, you can safely ignore this message.
    /usr/local/lib/python3.7/dist-packages/transformers/optimization.py:309:
    FutureWarning: This implementation of AdamW is deprecated and will be removed in
    a future version. Use the PyTorch implementation torch.optim.AdamW instead, or
    set `no_deprecation_warning=True` to disable this warning
      FutureWarning,
    ***** Running training *****
      Num examples = 6851
      Num Epochs = 4
      Instantaneous batch size per device = 8
      Total train batch size (w. parallel, distributed & accumulation) = 8
      Gradient Accumulation steps = 1
      Total optimization steps = 3428
    <IPython.core.display.HTML object>
    The following columns in the evaluation set don't have a corresponding argument
    in `BertForSequenceClassification.forward` and have been ignored: text,
    __index_level_0__. If text, __index_level_0__ are not expected by
    `BertForSequenceClassification.forward`, you can safely ignore this message.
    ***** Running Evaluation *****
```

```
Num examples = 762
 Batch size = 8
Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857
Configuration saved in ./save model/bert-base-uncased-finetuned-
tweet/checkpoint-857/config.json
Model weights saved in ./save model/bert-base-uncased-finetuned-
tweet/checkpoint-857/pytorch_model.bin
tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/tokenizer_config.json
Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-857/special_tokens_map.json
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
__index_level_0__. If text, __index_level_0__ are not expected by
`BertForSequenceClassification.forward`, you can safely ignore this message.
***** Running Evaluation *****
 Num examples = 762
 Batch size = 8
Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714
Configuration saved in ./save model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/config.json
Model weights saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/pytorch_model.bin
tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/tokenizer_config.json
Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-1714/special_tokens_map.json
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
__index_level_0__. If text, __index_level_0__ are not expected by
`BertForSequenceClassification.forward`, you can safely ignore this message.
***** Running Evaluation *****
 Num examples = 762
 Batch size = 8
Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-2571
Configuration saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-2571/config.json
Model weights saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-2571/pytorch_model.bin
tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-2571/tokenizer_config.json
Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
tweet/checkpoint-2571/special_tokens_map.json
The following columns in the evaluation set don't have a corresponding argument
in `BertForSequenceClassification.forward` and have been ignored: text,
```

```
__index_level_0__. If text, __index_level_0__ are not expected by
    `BertForSequenceClassification.forward`, you can safely ignore this message.
    **** Running Evaluation ****
      Num examples = 762
      Batch size = 8
    Saving model checkpoint to ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428
    Configuration saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/config.json
    Model weights saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/pytorch_model.bin
    tokenizer config file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/tokenizer_config.json
    Special tokens file saved in ./save_model/bert-base-uncased-finetuned-
    tweet/checkpoint-3428/special_tokens_map.json
    Training completed. Do not forget to share your model on huggingface.co/models
    =)
    Loading best model from ./save model/bert-base-uncased-finetuned-
    tweet/checkpoint-2571 (score: 0.8267629388511841).
[]: TrainOutput(global_step=3428, training_loss=0.2242263940835639,
    metrics={'train_runtime': 435.6999, 'train_samples_per_second': 62.897,
     'train_steps_per_second': 7.868, 'total_flos': 709032391428420.0, 'train_loss':
     0.2242263940835639, 'epoch': 4.0})
[]:
```