

```
In [1]: from sklearn.model_selection import train_test_split

        from transformers import T5Tokenizer, T5ForConditionalGeneration

        from transformers import AdamW
        import pandas as pd
        import torch
        import pytorch_lightning as pl
        from pytorch_lightning.callbacks import ModelCheckpoint
        from torch.nn.utils.rnn import pad_sequence
        # from torch.utils.data import Dataset, DataLoader, random_split, RandomSampler, Se

        pl.seed_everything(100)
        import warnings
        warnings.filterwarnings("ignore")
```

```
In [2]: data = pd.read_csv("/kaggle/input/conversation-chatbot1/Conversation_Chatbot (1).cs
```

```
In [3]: print("No of rows:" ,data.shape[0])
```

No of rows: 130

Here **PyTorch-lightning** is used: PyTorch Lightning is a lightweight interface for PyTorch that simplifies the process of training deep learning models. It provides pre-built components and features for common tasks, making the code more modular and reusable. PyTorch Lightning also provides various features such as automatic checkpointing, distributed training, and multi-GPU training. It follows a strict design pattern and provides hooks and callbacks for customization. It is compatible with various hardware platforms such as CPUs and GPUs.

```
In [4]: print("No of rows:" ,data.shape[0])
```

No of rows: 130

The task is to create a conversational model that can generate natural and engaging responses to a given input text. The model should be able to understand the context of the conversation and generate appropriate responses that are relevant to the topic and flow of the conversation. Additionally, the model should be able to handle open-ended conversations, where the topic can change dynamically, and maintain coherence throughout the conversation.

```
In [5]: DEVICE = torch.device('cuda' if torch.cuda.is_available() else 'cpu')
        INPUT_MAX_LEN = 128 #input length
        OUTPUT_MAX_LEN = 128 # output length
        TRAIN_BATCH_SIZE = 8 # batch size of training
        VAL_BATCH_SIZE = 2 # batch size for validation
        EPOCHS = 5 # number of epoch
```

```
In [6]: MODEL_NAME = "t5-base"
        tokenizer = T5Tokenizer.from_pretrained(MODEL_NAME, model_max_length=512)
```

Downloading (...)ve/main/spiece.model: 0% | 0.00/792k [00:00<?, ?B/s]

Downloading (...)lve/main/config.json: 0%| | 0.00/1.21k [00:00<?, ?B/s]

Example of how T5 Tokenizer actually work.

```
In [7]: text = "Hello, how are you today?"      # assume the text that is to be tokenized

input_tokenize = tokenizer(
    text,
    add_special_tokens=True,          #Add Special tokens like [CLS] and [SEP]
    max_length=128,                  #for padding to max_length for equal se
    padding = 'max_length',          #truncate the text if it is greater tha
    truncation = True,               #will return attention mask
    return_attention_mask=True,      #return tensor formate
    return_tensors="pt"
)
```

```
In [8]: print("input_ids: ", input_tokenize['input_ids'].flatten())
print("-----")
print("Attention Mask: ", input_tokenize['attention_mask'].flatten())

input_ids:  tensor([8774,   6, 149,  33,  25, 469,  58,   1,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,   0,
                    0,   0,   0,   0,   0,   0,   0,   0])

-----
Attention Mask:  tensor([1, 1, 1, 1, 1, 1, 1, 1, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
                        0, 0, 0, 0, 0,
                        0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
                        0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
                        0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0,
                        0, 0, 0, 0, 0, 0, 0, 0])
```

```
In [9]: class T5Dataset:

    def __init__(self, question, answer):

        self.question = question
        self.answer = answer
        self.tokenizer = tokenizer
        self.input_max_len = INPUT_MAX_LEN
        self.output_max_len = OUTPUT_MAX_LEN

    def __len__(self):                                # This method retrives the number of item
        return len(self.question)

    def __getitem__(self, item):                      # This method retrieves the item at the s

        question = str(self.question[item])
        question = ''.join(question.split())

        answer = str(self.answer[item])
        answer = ''.join(answer.split())

        input_tokenize = self.tokenizer(
            question,
            add_special_tokens=True,
            max_length=self.input_max_len,
            padding = 'max_length',
            truncation = True,
            return_attention_mask=True,
            return_tensors="pt"
        )
        output_tokenize = self.tokenizer(
            answer,
            add_special_tokens=True,
            max_length=self.output_max_len,
            padding = 'max_length',
            truncation = True,
            return_attention_mask=True,
            return_tensors="pt"
        )

        input_ids = input_tokenize["input_ids"].flatten()
        attention_mask = input_tokenize["attention_mask"].flatten()
        labels = output_tokenize['input_ids'].flatten()

        out = {
            'question':question,
            'answer':answer,
            'input_ids': input_ids,
            'attention_mask':attention_mask,
            'target':labels
        }

    return out
```

```
In [10]: class T5DataLoad(pl.LightningDataModule):

    def __init__(self, df_train, df_test):
        super().__init__()
        self.df_train = df_train
        self.df_test = df_test
        self.tokenizer = tokenizer
        self.input_max_len = INPUT_MAX_LEN
        self.out_max_len = OUTPUT_MAX_LEN

    def setup(self, stage=None):

        self.train_data = T5Dataset(
            question = self.df_train.question.values,
            answer = self.df_train.answer.values
        )

        self.valid_data = T5Dataset(
            question = self.df_test.question.values,
            answer = self.df_test.answer.values
        )

    def train_dataloader(self):
        return torch.utils.data.DataLoader(
            self.train_data,
            batch_size= TRAIN_BATCH_SIZE,
            shuffle=True,
            num_workers=2
        )

    def val_dataloader(self):
        return torch.utils.data.DataLoader(
            self.valid_data,
            batch_size= VAL_BATCH_SIZE,
            num_workers = 2
        )
```

```
In [11]: class T5Model(pl.LightningModule):

    def __init__(self):
        super().__init__()
        self.model = T5ForConditionalGeneration.from_pretrained(MODEL_NAME, return_

    def forward(self, input_ids, attention_mask, labels=None):

        output = self.model(
            input_ids=input_ids,
            attention_mask=attention_mask,
            labels=labels
        )
        return output.loss, output.logits

    def training_step(self, batch, batch_idx):

        input_ids = batch["input_ids"]
        attention_mask = batch["attention_mask"]
        labels= batch["target"]
        loss, logits = self(input_ids , attention_mask, labels)

        self.log("train_loss", loss, prog_bar=True, logger=True)

        return {'loss': loss}

    def validation_step(self, batch, batch_idx):
        input_ids = batch["input_ids"]
        attention_mask = batch["attention_mask"]
        labels= batch["target"]
        loss, logits = self(input_ids, attention_mask, labels)

        self.log("val_loss", loss, prog_bar=True, logger=True)

        return {'val_loss': loss}

    def configure_optimizers(self):
        return AdamW(self.parameters(), lr=0.0001)
```

Final Training Step

```
In [12]: def run():
df_train, df_test = train_test_split(data, test_size = 0.2, random_state=100)
dataload = T5DataLoad(df_train, df_test)
dataload.setup()
device = DEVICE
model = T5Model()
model.to(device)

checkpoint = ModelCheckpoint(
    dirpath="/kaggle/working",
    filename='best-model',
    save_top_k=2,
    verbose=True,
    monitor="val_loss",
    mode="min"
)
trainer = pl.Trainer(
    callbacks = checkpoint,
    max_epochs= 1,
    gpus=1,
    accelerator="gpu"
)
trainer.fit(model, dataload)
run()
```

```
Downloading (...) "pytorch_model.bin";: 0%|          | 0.00/892M [00:00<?, ?B/s]
Downloading (...) neration_config.json: 0%|          | 0.00/147 [00:00<?, ?B/s]
Sanity Checking: 0it [00:00, ?it/s]
Training: 0it [00:00, ?it/s]
Validation: 0it [00:00, ?it/s]
```



```
In [13]: train_model = T5Model.load_from_checkpoint('/kaggle/working/best-model.ckpt')
train_model.freeze()

def generate_question(question):

    inputs_encoding = tokenizer(
        question,
        add_special_tokens=True,
        max_length= INPUT_MAX_LEN,
        padding = 'max_length',
        truncation='only_first',
        return_attention_mask=True,
        return_tensors="pt"
    )

    generate_ids = train_model.model.generate(
        input_ids = inputs_encoding["input_ids"],
        attention_mask = inputs_encoding["attention_mask"],
        max_length = INPUT_MAX_LEN,
        num_beams = 4,
        num_return_sequences = 1,
        no_repeat_ngram_size=2,
        early_stopping=True,
    )

    preds = [
        tokenizer.decode(gen_id,
            skip_special_tokens=True,
            clean_up_tokenization_spaces=True)
        for gen_id in generate_ids
    ]

    return "".join(preds)
```

Model Evaluation

```
In [14]: ques = "hi, how are you doing?"
print("Ques: ",ques)
print("BOT: ",generate_question(ques))
```

Ques: hi, how are you doing?
BOT: hi, how are you doing?

```
In [15]: ques = "how's it going?"
print("Ques: ",ques)
print("BOT: ",generate_question(ques))
```

Ques: how's it going?
BOT: ?

```
In [16]: ques = "i heard that it's going to be warm this weekend."
print("Ques: ",ques)
print("BOT: ",generate_question(ques))
```

Ques: i heard that it's going to be warm this weekend.

BOT: i heard that it's going to be warm this weekend.