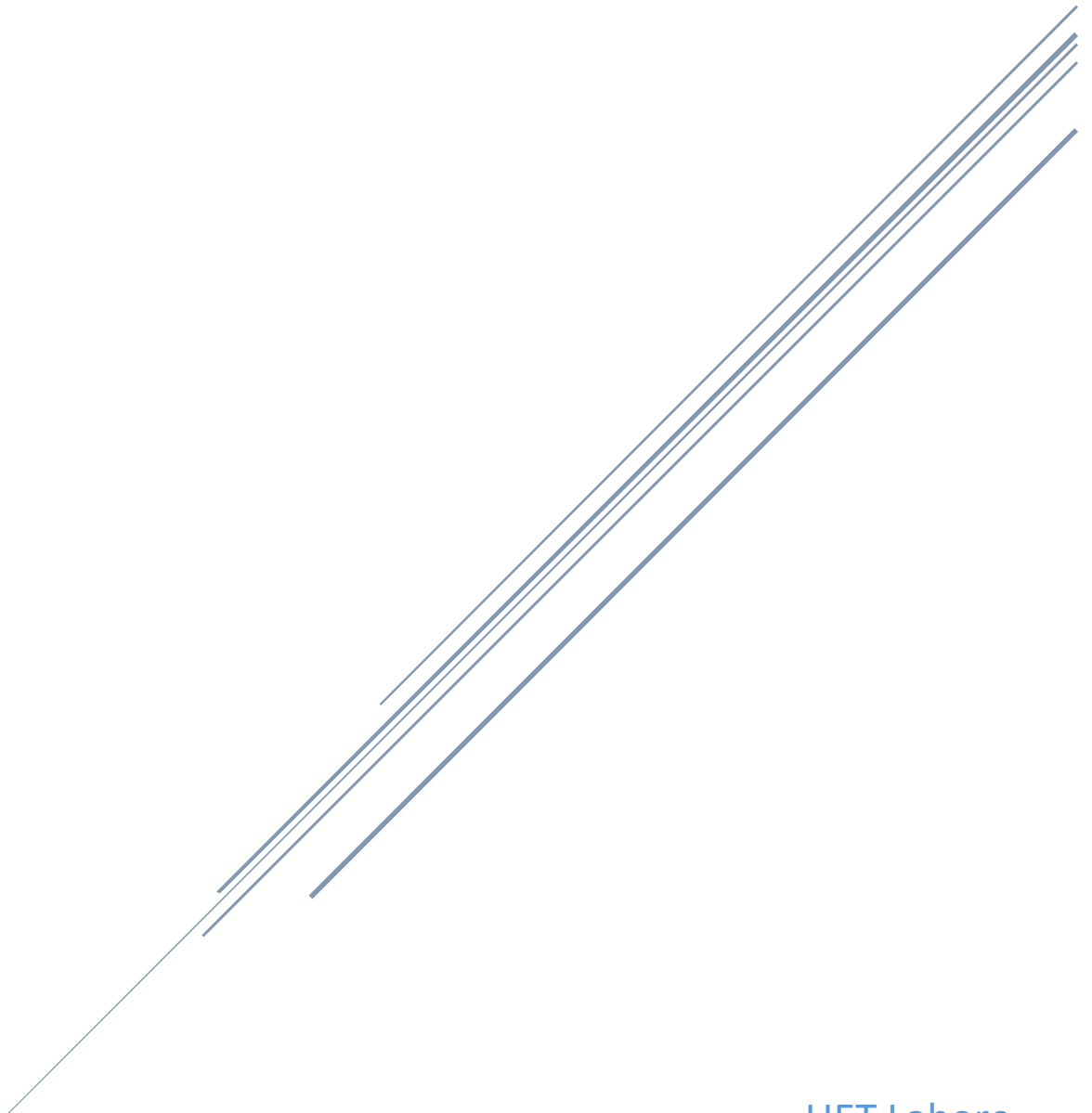


# AAMIR ABBAS

Advanced Big Data Analytics



UET Lahore  
REG# 2023 MSDS 04

## **TASK 1**

### **Q1.1 Respond with insights grounded in the terminology of Large Language Models.**

- (1). Can you provide a high-level overview of Transformers' architecture?**
- (2). What are the two approaches for evaluating language models in NLP, providing brief descriptions of each method along with highlighting their key distinctions?**
- (3). What is a token in the Large Language Models?**

#### **1). Overview of Transformers' Architecture:**

Ans: Transformers are a type of neural network architecture that has proven to be highly effective in natural language processing (NLP) tasks and other machine learning applications. The architecture was introduced in the paper "Attention is All You Need" by Vaswani et al. in 2017. Here's a high-level overview of the Transformer architecture:

##### **1. Self-Attention Mechanism:**

Allows the model to focus on different parts of the input sequence when making predictions.

##### **2. Multi-Head Attention:**

Uses multiple self-attention mechanisms to capture different aspects of the input.

##### **3. Positional Encoding:**

Adds information about the position of each word in the sequence.

##### **4. Feedforward Neural Network:**

Applies a simple neural network to process the attention outputs.

##### **5. Layer Normalization and Residual Connections:**

Helps in training deeper models by normalizing and connecting sub-layers.

##### **6. Encoder and Decoder Stacks:**

Multiple layers of the above components stacked together.

##### **7. Masked Self-Attention in Decoders:**

During training, prevents the model from looking ahead in the sequence.

##### **8. Output Layer:**

Produces the final predictions based on the processed information.

---

## 2). What are the two approaches for evaluating language models in NLP, providing brief descriptions of each method along with highlighting their key distinctions?

Ans: There are two ways to evaluate language models in NLP:

### 1. Intrinsic Evaluation:

What it does: Tests the model on specific language tasks like predicting the next word or recognizing parts of speech.

Why it's useful: Helps understand how well the model handles individual language aspects.

### 2. Extrinsic Evaluation:

What it does: Puts the model to the test in real-world applications, like translation or summarization.

Why it's useful: Shows how effective the model is in practical, broader language use.

### Key Difference:

**Intrinsic:** Specific language tasks, direct metrics.

**Extrinsic:** Real-world applications, broader metrics.

Both evaluations together give a full picture of how good a language model is at understanding and using language.

---

## 3). What is a token in the Large Language Models?

Ans: Tokens are the fundamental building blocks that LLMs use to process and understand language. Like words in human language, they are the smallest meaningful units that LLMs can work with.

### Key points:

- Not always individual words: Tokens can be words, but they can also be subwords, characters, or even entire phrases, depending on the model and task.
- Created through tokenization: The process of dividing text into tokens is called tokenization.
- Vital for language understanding: LLMs use tokens to represent and analyze the structure and meaning of language.
- Input and output: Tokens serve as both the input and output for LLMs during tasks like text generation and translation.

### Example:

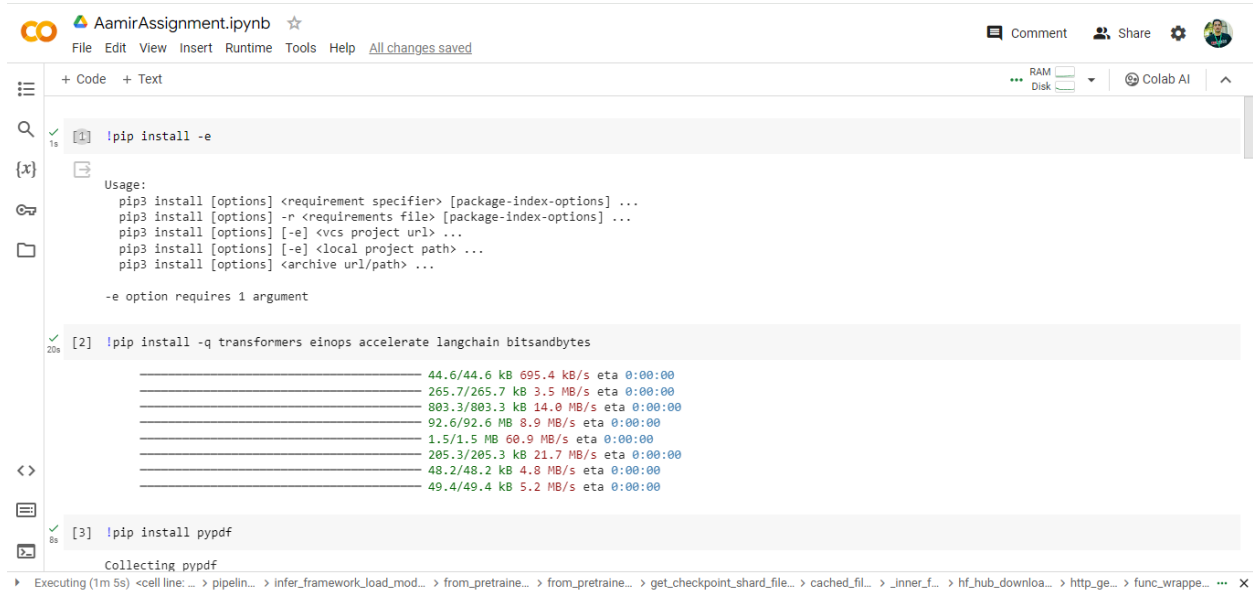
Consider the sentence "I love reading books." Here are possible tokenizations:

Word-based: ["I", "love", "reading", "books"]

---

## Q1.2 Read through the tutorial slides and deploy Llama 2 on Google Colab and get inference from the model. (10 pts)

(1). Provide screenshots of the results after you successfully download the model and see the text generated.



The screenshot shows a Google Colab notebook titled "AamirAssignment.ipynb". The notebook has three code cells. The first cell contains the command `!pip install -e`, which outputs the usage for `pip3 install` and a message that the `-e` option requires 1 argument. The second cell contains the command `!pip install -q transformers einops accelerate langchain bitsandbytes`, which outputs progress bars for the installation of each package. The third cell contains the command `!pip install pypdf`, which outputs "Collecting pypdf". The notebook interface includes a menu bar with "File", "Edit", "View", "Insert", "Runtime", "Tools", and "Help", and a toolbar with "Comment", "Share", and "Colab AI" buttons. The status bar at the bottom indicates "Executing (1m 5s)" and shows the current cell's progress.

```
[1] !pip install -e

Usage:
  pip3 install [options] <requirement specifier> [package-index-options] ...
  pip3 install [options] -r <requirements file> [package-index-options] ...
  pip3 install [options] [-e] <vcs project url> ...
  pip3 install [options] [-e] <local project path> ...
  pip3 install [options] <archive url/path> ...

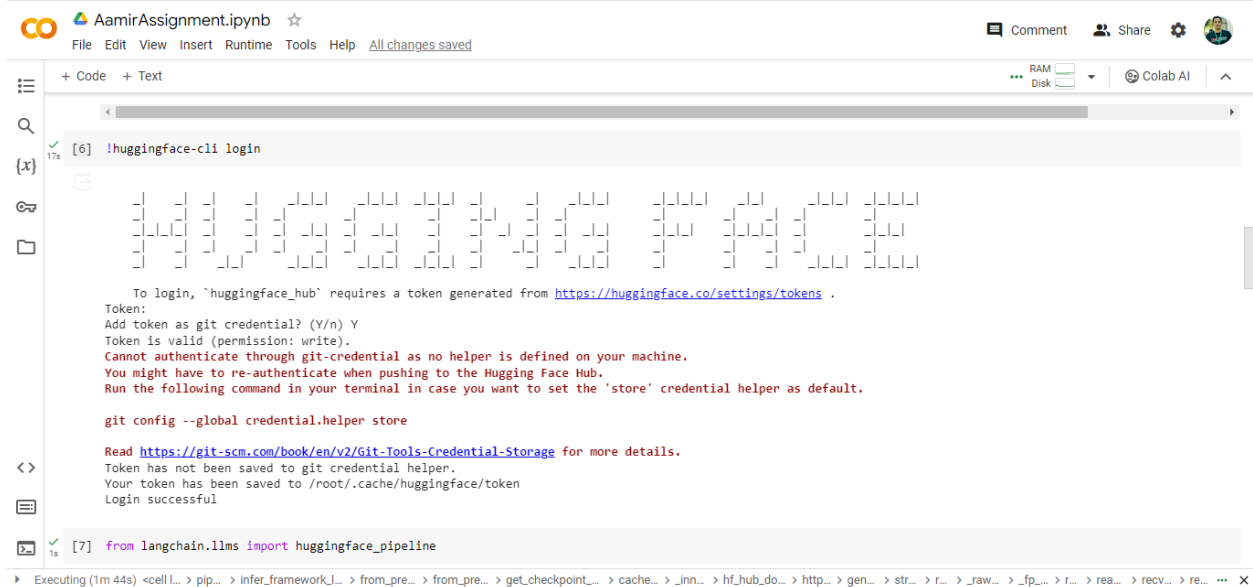
-e option requires 1 argument

[2] !pip install -q transformers einops accelerate langchain bitsandbytes

44.6/44.6 kB 695.4 kB/s eta 0:00:00
265.7/265.7 kB 3.5 MB/s eta 0:00:00
803.3/803.3 kB 14.0 MB/s eta 0:00:00
92.6/92.6 MB 8.9 MB/s eta 0:00:00
1.5/1.5 MB 60.9 MB/s eta 0:00:00
205.3/205.3 kB 21.7 MB/s eta 0:00:00
48.2/48.2 kB 4.8 MB/s eta 0:00:00
49.4/49.4 kB 5.2 MB/s eta 0:00:00

[3] !pip install pypdf

Collecting pypdf
```



The screenshot shows the same Google Colab notebook with two additional code cells. The fourth cell contains the command `!huggingface-cli login`, which outputs a ASCII art representation of a face and instructions for logging in to Hugging Face. The fifth cell contains the command `from langchain.llms import huggingface_pipeline`, which outputs "Login successful". The notebook interface is consistent with the previous screenshot, showing the same menu bar, toolbar, and status bar.

```
[6] !huggingface-cli login

To login, 'huggingface_hub' requires a token generated from https://huggingface.co/settings/tokens .
Token:
Add token as git credential? (Y/n) Y
Token is valid (permission: write).
Cannot authenticate through git-credential as no helper is defined on your machine.
You might have to re-authenticate when pushing to the Hugging Face Hub.
Run the following command in your terminal in case you want to set the 'store' credential helper as default.

git config --global credential.helper store

Read https://git-scm.com/book/en/v2/Git-Tools-Credential-Storage for more details.
Token has not been saved to git credential helper.
Your token has been saved to /root/.cache/huggingface/token
Login successful

[7] from langchain.llms import huggingface_pipeline
```

CO

AamirAssignment.ipynb

☆

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[10] import torch

[11] import warnings

[12] model = "meta-llama/Llama-2-7b-chat-hf"

[13] Tokenizer=AutoTokenizer.from\_pretrained(model)

/usr/local/lib/python3.10/dist-packages/huggingface\_hub/utils/\_token.py:72: UserWarning:  
The secret "HF\_TOKEN" does not exist in your Colab secrets.  
To authenticate with the Hugging Face Hub, create a token in your settings tab (<https://huggingface.co/settings/tokens>), set it as secret in your Google Colab and  
You will be able to reuse this secret in all of your notebooks.  
Please note that authentication is recommended but still optional to access public models or datasets.  
warnings.warn(  
tokenizer\_config.json: 100% ██████████ 1.62k/1.62k [00:00<00:00, 35.8kB/s]  
tokenizer.model: 100% ██████████ 500k/500k [00:00<00:00, 6.91MB/s]  
tokenizer.json: 100% ██████████ 1.84M/1.84M [00:00<00:00, 18.9MB/s]  
special\_tokens\_map.json: 100% ██████████ 414/414 [00:00<00:00, 12.6kB/s]

Executing (2m 6s) <cell line: ...> > pipelin...> infer\_framework\_load\_mod...> from\_pretraine...> from\_pretraine...> get\_checkpoint\_shard\_file...> cached\_fil...> \_inner\_f...> hf\_hub\_downloa...> http\_ge...> func\_wrappe...

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Access Tokens

User Access Tokens

Access tokens programmatically authenticate your identity to the Hugging Face Hub, allowing applications to perform specific actions specified by the scope of permissions (read, write, or admin) granted. Visit the [documentation](#) to discover how to use them.

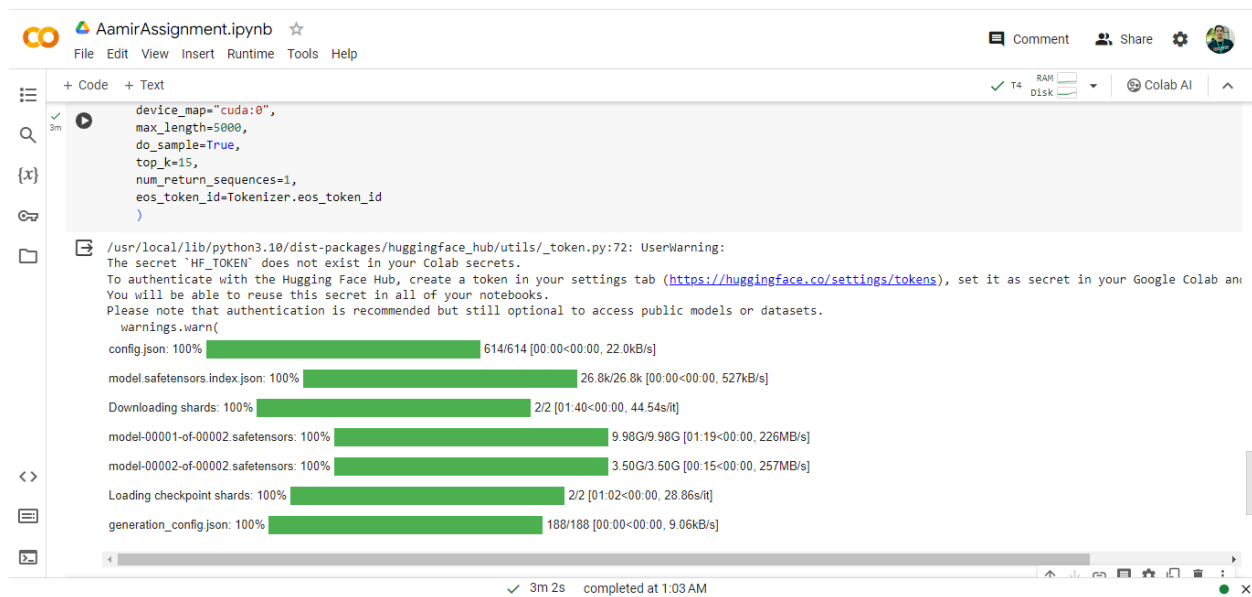
SeaToken WRITE Manage

..... Show

New token

<https://huggingface.co/settings/billing>

## (2). Change the “max\_length” variable in pipline and observe the difference.



```
device_map="cuda:0",
max_length=5000,
do_sample=True,
top_k=15,
num_return_sequences=1,
eos_token_id=Tokenizer.eos_token_id
)
```

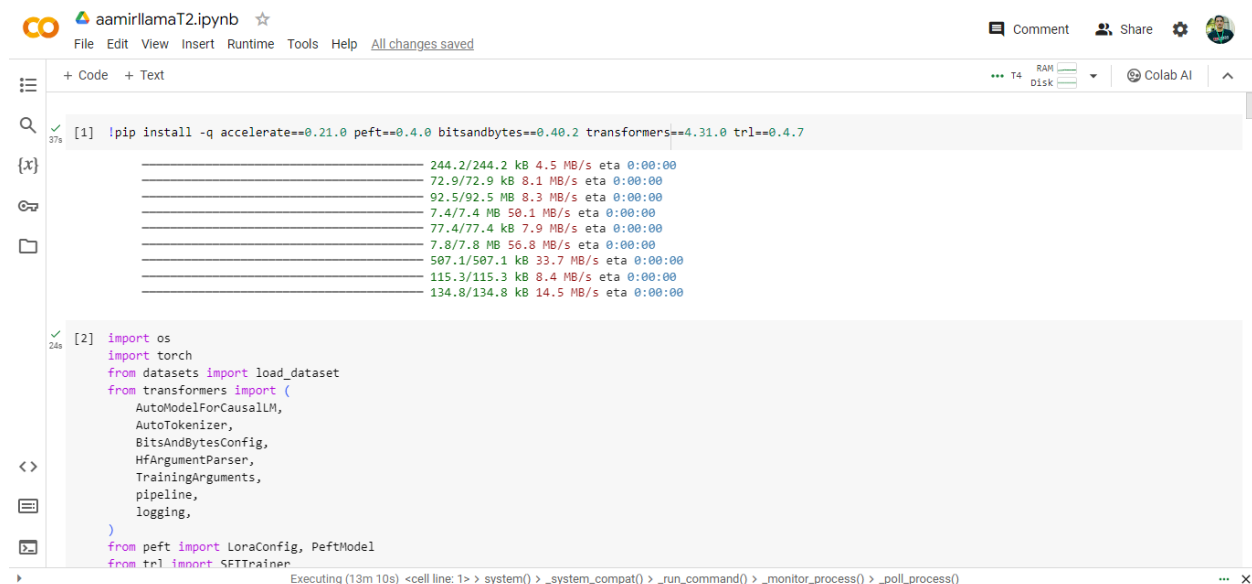
/usr/local/lib/python3.10/dist-packages/huggingface\_hub/utils/\_token.py:72: UserWarning:  
The secret 'HF\_TOKEN' does not exist in your Colab secrets.  
To authenticate with the Hugging Face Hub, create a token in your settings tab (<https://huggingface.co/settings/tokens>), set it as secret in your Google Colab and You will be able to reuse this secret in all of your notebooks.  
Please note that authentication is recommended but still optional to access public models or datasets.  
warnings.warn(  
config.json: 100% ██████████ 614/614 [00:00<00:00, 22.0kB/s]  
model.safetensors.index.json: 100% ██████████ 26.8k/26.8k [00:00<00:00, 527kB/s]  
Downloading shards: 100% ██████████ 2/2 [01:40<00:00, 44.54s/it]  
model-00001-of-00002.safetensors: 100% ██████████ 9.98G/9.98G [01:19<00:00, 226MB/s]  
model-00002-of-00002.safetensors: 100% ██████████ 3.50G/3.50G [00:15<00:00, 257MB/s]  
Loading checkpoint shards: 100% ██████████ 2/2 [01:02<00:00, 28.86s/it]  
generation\_config.json: 100% ██████████ 188/188 [00:00<00:00, 9.06kB/s]

3m 2s completed at 1:03 AM

## Task 2

In this part you are going to fine tuning Llama 2 models based on OpenAssistant dataset.

### Q2.1 Write comments for each line of code and succinctly explain what it is doing.



```
[1] !pip install -q accelerate==0.21.0 peft==0.4.0 bitsandbytes==0.40.2 transformers==4.31.0 trl==0.4.7
```

```
[2] import os
import torch
from datasets import load_dataset
from transformers import (
    AutoModelForCausalLM,
    AutoTokenizer,
    BitsAndBytesConfig,
    HfArgumentParser,
    TrainingArguments,
    pipeline,
    logging,
)
from peft import LoraConfig, PeftModel
from trl import SFTTrainer
```

Executing (13m 10s) <cell line: 1> > system() > \_system\_compat() > \_run\_command() > \_monitor\_process() > \_poll\_process()





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Datasets:

aamirsea/aamir-huggingface

like 0

License: Llama2



Dataset card



Files and versions



Community



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main

aamir-huggingface

1 contributor

History: 2 commits

+ Add file



aamirsea

Upload train-00000-of-00001-9ad84bb9cf65a42f.parquet

4c1d000

about 1 hour ago



.gitattributes

2.31 kB



initial commit

about 1 hour ago



README.md

24 Bytes



initial commit

about 1 hour ago



train-00000-of-00001-9ad84bb9cf6...

967 kB



Upload train-00000-of-00001-9ad84bb9cf65a42f.parquet

about 1 hour ago



aamirlamaT2.ipynb

File Edit View Insert Runtime Tools Help All changes saved

Comment

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```
[6]
# Apply the new template
reformatted_segments.append(f'<s>[INST] {human_text} [/INST] {assistant_text} </s>')
else:
    # Handle the case where there is no corresponding assistant segment
    reformatted_segments.append(f'<s>[INST] {human_text} [/INST] </s>')

return {'text': ''.join(reformatted_segments)}

# Apply the transformation
transformed_dataset = dataset.map(transform_conversation)
```

```
/usr/local/lib/python3.10/dist-packages/huggingface_hub/utils/_token.py:72: UserWarning:
The secret `HF_TOKEN` does not exist in your Colab secrets.
To authenticate with the Hugging Face Hub, create a token in your settings tab (https://huggingface.co/settings/tokens), set it as secret in your Google Colab and
You will be able to reuse this secret in all of your notebooks.
Please note that authentication is recommended but still optional to access public models or datasets.
warnings.warn(
Downloading readme: 100% 24.0/24.0 [00:00<00:00, 1.30kB/s]
Downloading data: 100% 967k/967k [00:01<00:00, 514kB/s]
Generating train split: 1000/0 [00:00<00:00, 8838.11 examples/s]
Map: 100% 1000/1000 [00:00<00:00, 2682.04 examples/s]
```

Executing (T4m 24s) <cell line: 1> > system() > \_system\_compat() > \_run\_command() > \_monitor\_process() > \_poll\_process()



The screenshot displays two instances of the Google Colab web interface. Both notebooks are named "aamirllamaT2.ipynb".

**Top Notebook:**

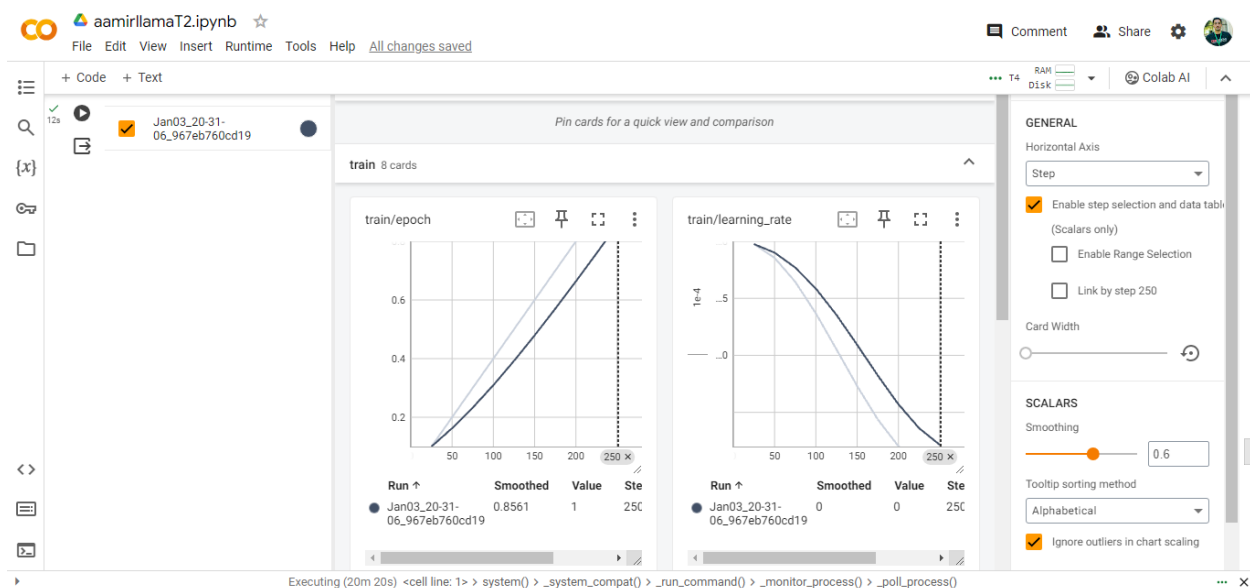
- Status: Executing (19m 8s)
- Code Cell [7]: Shows progress bars for downloading and loading various files:
  - config.json: 100% (614/614) [00:00<00:00, 41.5kB/s]
  - model.safetensors.index.json: 100% (26.8k/26.8k) [00:00<00:00, 1.34MB/s]
  - Downloading shards: 100% (2/2) [02:35<00:00, 75.88s/it]
  - model-00001-of-00002.safetensors: 100% (9.98G/9.98G) [01:25<00:00, 55.8MB/s]
  - model-00002-of-00002.safetensors: 100% (3.50G/3.50G) [01:04<00:00, 37.8MB/s]
  - Loading checkpoint shards: 100% (2/2) [01:12<00:00, 32.97s/it]
  - generation\_config.json: 100% (188/188) [00:00<00:00, 11.1kB/s]
  - tokenizer\_config.json: 100% (1.62k/1.62k) [00:00<00:00, 110kB/s]
  - tokenizer.model: 100% (500k/500k) [00:00<00:00, 22.4MB/s]
  - tokenizer.json: 100% (1.84M/1.84M) [00:00<00:00, 26.5MB/s]
  - special\_tokens\_map.json: 100% (414/414) [00:00<00:00, 27.0kB/s]
- Output: Displays warnings from PyTorch and SFTTrainer regarding deprecated functions and missing arguments.

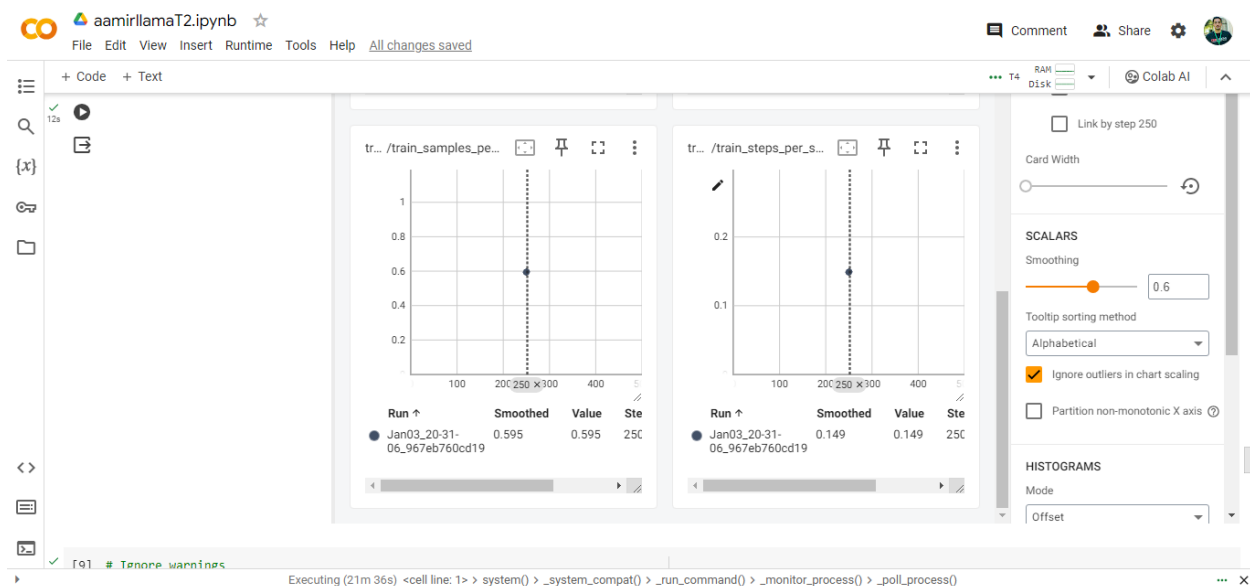
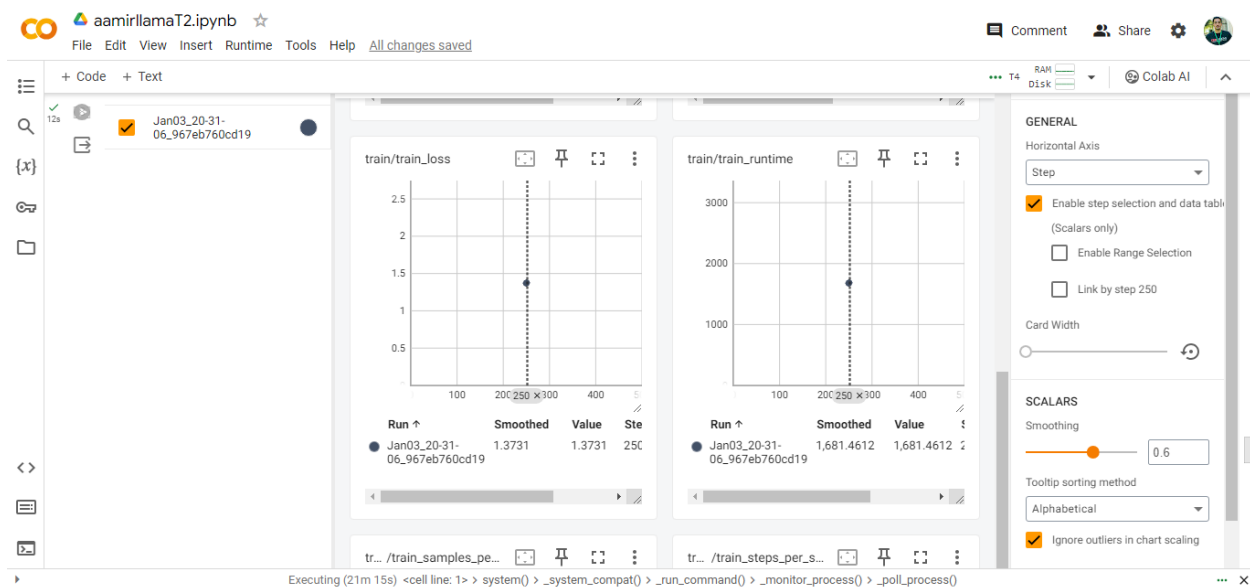
**Bottom Notebook:**

- Status: Executing (19m 42s)
- Code Cell [8]: Contains a command to load a tensorboard results file.
 

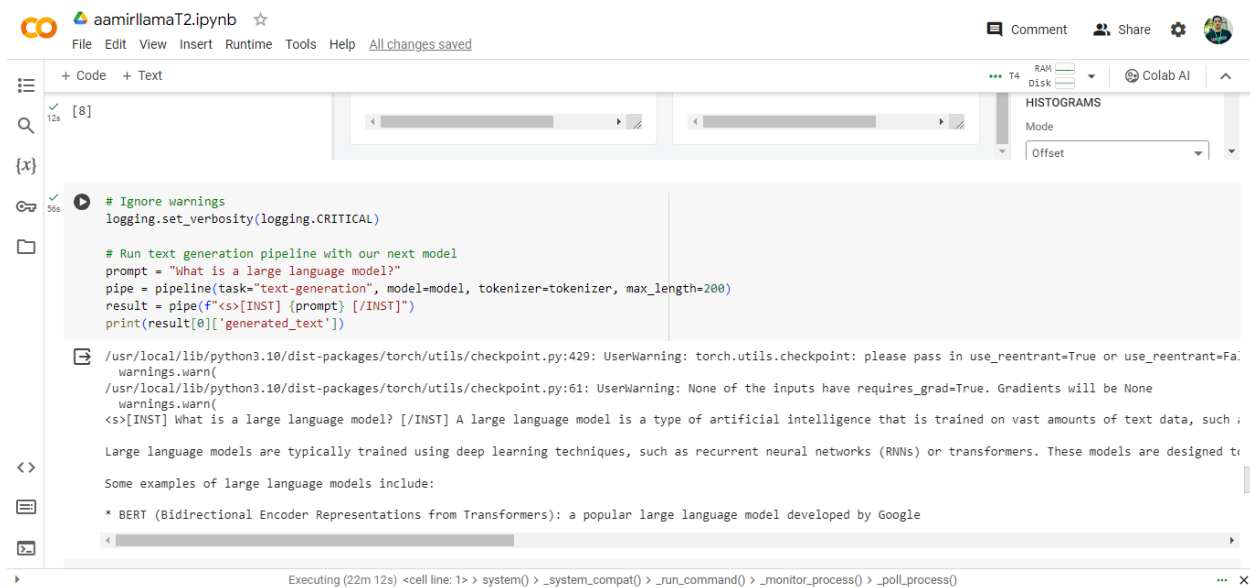
```
%load_ext tensorboard
%tensorboard --logdir results/runs
```
- Output: Displays the training progress as a table:
 

Step	Training Loss
25	1.411500
50	1.661400
75	1.230700
100	1.463800
125	1.190200
150	1.383200
175	1.185500
200	1.482900
225	1.168800
250	1.552900





## Q2.3 Use the text generation pipeline to ask questions like “What is a large language model?”



```
# Ignore warnings
logging.set_verbosity(logging.CRITICAL)

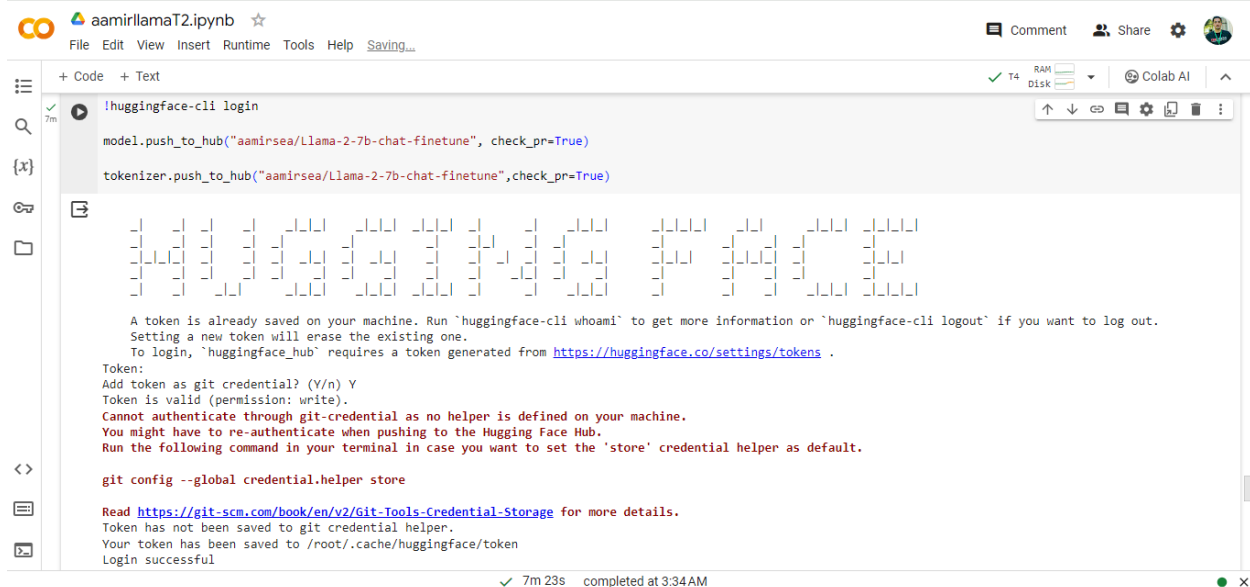
# Run text generation pipeline with our next model
prompt = "What is a large language model?"
pipe = pipeline(task="text-generation", model=model, tokenizer=tokenizer, max_length=200)
result = pipe(f"<>[INST] {prompt} [/INST]")
print(result[0]['generated_text'])
```

/usr/local/lib/python3.10/dist-packages/torch/utils/checkpoint.py:429: UserWarning: torch.utils.checkpoint: please pass in use\_reentrant=True or use\_reentrant=False in this call. Default will be True in future releases. (Triggered at: /usr/local/lib/python3.10/dist-packages/torch/utils/checkpoint.py:61: UserWarning: None of the inputs have requires\_grad=True. Gradients will be None)

<>[INST] What is a large language model? [/INST] A large language model is a type of artificial intelligence that is trained on vast amounts of text data, such as books, websites, and social media. Large language models are typically trained using deep learning techniques, such as recurrent neural networks (RNNs) or transformers. These models are designed to generate human-like text based on the input prompt. Some examples of large language models include:

- \* BERT (Bidirectional Encoder Representations from Transformers): a popular large language model developed by Google

## Q 2.4 Store fine-tuning Llama2 Model and push Model to your Hugging Face Hub. Provide screenshot of your Hugging Face model page.



```
!huggingface-cli login

model.push_to_hub("aamirsea/Llama-2-7b-chat-finetune", check_pr=True)

tokenizer.push_to_hub("aamirsea/Llama-2-7b-chat-finetune", check_pr=True)
```

A token is already saved on your machine. Run `'huggingface-cli whoami'` to get more information or `'huggingface-cli logout'` if you want to log out. Setting a new token will erase the existing one. To login, `'huggingface_hub'` requires a token generated from <https://huggingface.co/settings/tokens>.

Token:  
Add token as git credential? (Y/n) Y  
Token is valid (permission: write).  
Cannot authenticate through git-credential as no helper is defined on your machine.  
You might have to re-authenticate when pushing to the Hugging Face Hub.  
Run the following command in your terminal in case you want to set the 'store' credential helper as default.

```
git config --global credential.helper store
```

Read <https://git-scm.com/book/en/v2/Git-Tools-Credential-Storage> for more details.  
Token has not been saved to git credential helper.  
Your token has been saved to /root/.cache/huggingface/token  
Login successful

The screenshot displays a dual-pane environment. The top pane is a JupyterLab interface with a terminal window open. The terminal shows the execution of several commands: `git config --global credential.helper store`, `Read https://git-scm.com/book/en/v2/Git-Tools-Credential-Storage` for more details, and a successful login to the Hugging Face token registry. It also shows the upload progress of two files: `pytorch\_model-00002-of-00002.bin` (3.50G) and `pytorch\_model-00001-of-00002.bin` (9.98G). The bottom pane is a web browser showing the Hugging Face website. The main heading is "Hugging Face". Below it, there's a search bar and navigation links for Models, Datasets, Spaces, Docs, Solutions, Pricing, and a user profile icon. A message banner says "Hugging Face is way more fun with friends and colleagues! Join an organization". The main content area shows the model card for "aamirsea / Llama-2-7b-chat-finetune". It includes tabs for Text Generation, Transformers, PyTorch, llama, Inference Endpoints, and text-generation-inference. The "Files and versions" tab is active, showing a list of files uploaded by "aamirsea":

File	Size	Action	Time
.gitattributes	1.52 kB	Download	initial commit
config.json	639 Bytes	Download	Upload LlamaForCausalLM
generation_config.json	183 Bytes	Download	Upload LlamaForCausalLM
pytorch_model-00001-of-00002.bin	9.98 GB	LFS Download	Upload LlamaForCausalLM
pytorch_model-00002-of-00002.bin	3.5 GB	LFS Download	Upload LlamaForCausalLM
pytorch_model_bin_index.json	26.8 kB	Download	Unload LlamaForCausalLM



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aamirsea

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None yet

🧠 Models 1 🔍

🧠 aamirsea/Llama-2-7b-chat-finetune

🗨️ Text Generation • Updated 3 minutes ago

📄 Datasets 1 🔍

📄 aamirsea/aamir-huggingface

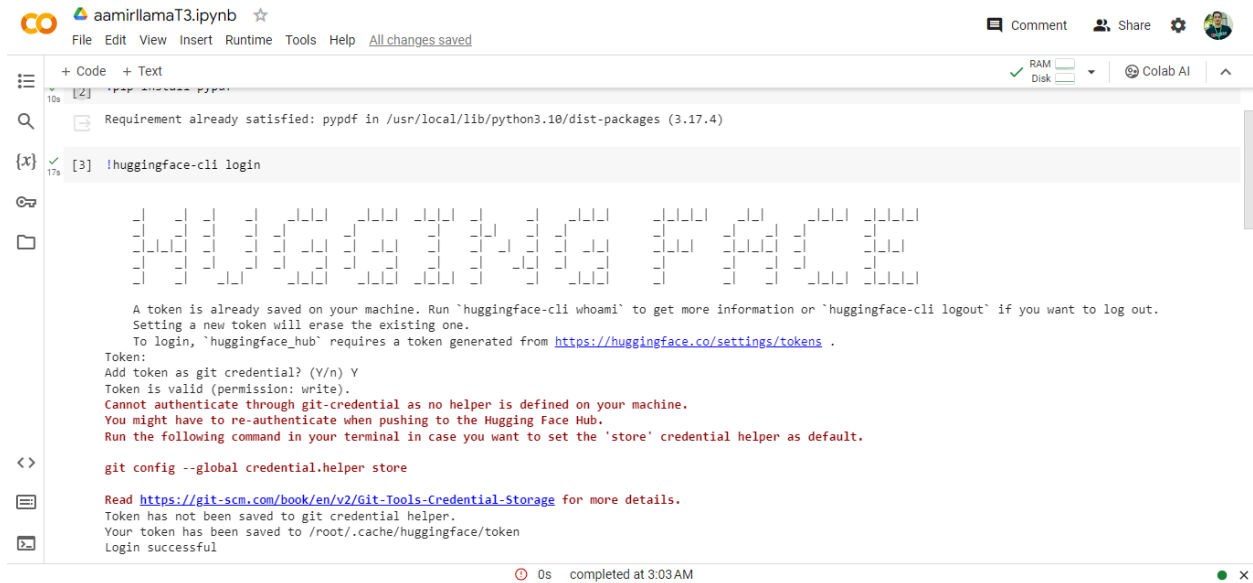
👁️ Viewer • Updated about 2 hours ago

### Task 3

In this section, your objective is to leverage the fine-tuning model from Task 2 to construct a versatile chatbot utilizing LangChain.

**Q3.1, Provide screenshots of the prompt template you have devised.**

**Q3.2, Provide the text generation outcomes achieved through your chatbot.**



```
Requirement already satisfied: pypdf in /usr/local/lib/python3.10/dist-packages (3.17.4)

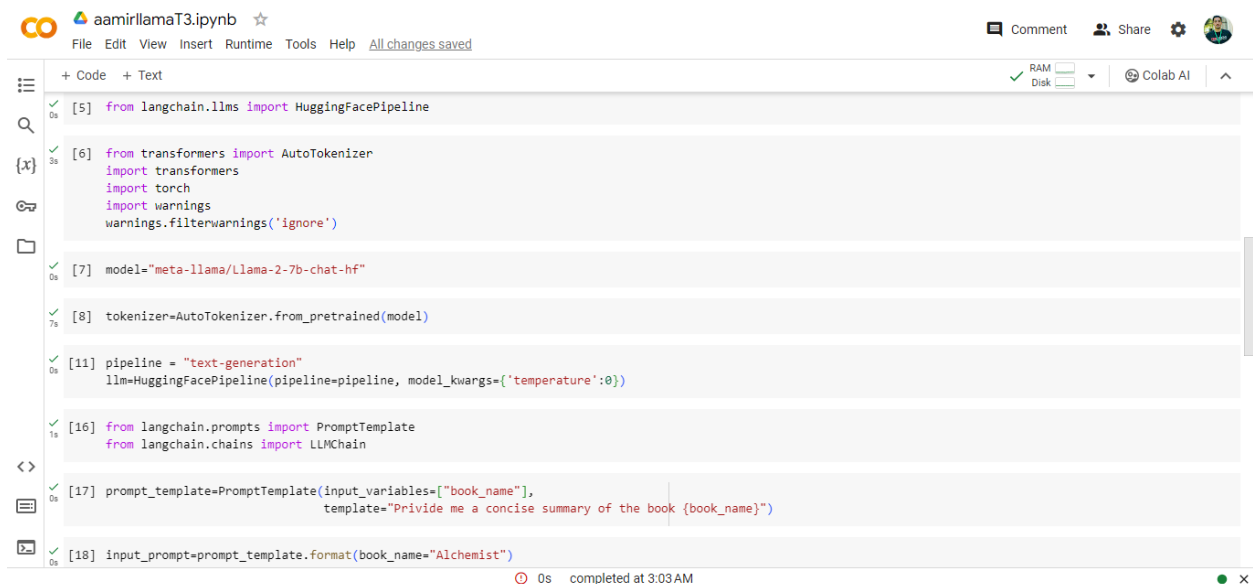
[3] !huggingface-cli login

      _ _ _ _ _
     _ _ _ _ _
    _ _ _ _ _
   _ _ _ _ _
  _ _ _ _ _
 _ _ _ _ _
_ _ _ _ _

A token is already saved on your machine. Run `huggingface-cli whoami` to get more information or `huggingface-cli logout` if you want to log out.
Setting a new token will erase the existing one.
To login, `huggingface_hub` requires a token generated from https://huggingface.co/settings/tokens .
Token:
Add token as git credential? (Y/n) Y
Token is valid (permission: write).
Cannot authenticate through git-credential as no helper is defined on your machine.
You might have to re-authenticate when pushing to the Hugging Face Hub.
Run the following command in your terminal in case you want to set the 'store' credential helper as default.

git config --global credential.helper store

Read https://git-scm.com/book/en/v2/Git-Tools-Credential-Storage for more details.
Token has not been saved to git credential helper.
Your token has been saved to /root/.cache/huggingface/token
Login successful
```



```
[5] from langchain.llms import HuggingFacePipeline

[6] from transformers import AutoTokenizer
import transformers
import torch
import warnings
warnings.filterwarnings('ignore')

[7] model="meta-llama/Llama-2-7b-chat-hf"

[8] tokenizer=AutoTokenizer.from_pretrained(model)

[11] pipeline = "text-generation"
llm=HuggingFacePipeline(pipeline=pipeline, model_kwargs={'temperature':0})

[16] from langchain.prompts import PromptTemplate
from langchain.chains import LLMChain

[17] prompt_template=PromptTemplate(input_variables=["book_name"],
                                template="Provide me a concise summary of the book {book_name}")

[18] input_prompt=prompt_template.format(book_name="Alchemist")
```

 aamirllamaT3.ipynb 

File Edit View Insert Runtime Tools Help [All changes saved](#)

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 [18] `input_prompt=prompt_template.format(book_name="Alchemist")`  
`print(input_prompt)`

 Provide me a concise summary of the book Alchemist

 [19] `prompt_template_name = PromptTemplate(`  
`input_variables=['product'],`  
`template = "What would be a good name for a company that makes {product}"`  
`)`

 [21] `from langchain.chains import ConversationChain`  
  
`convo = ConversationChain(llm=llm)`  
`print(convo.prompt.template)`  
  
The following is a friendly conversation between a human and an AI. The AI is talkative and provides lots of specific details from its context. If the AI does not  
  
Current conversation:  
{history}  
Human: {input}  
AI:

 Start coding or [generate](#) with AI.

 0s completed at 3:03AM

