## Question Answering

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```
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    Batch: 2022-2026
    Branch: Al-ML A1
    #Question-Answering by Fine-Tuning BERT
    ##Imports
[1]: import json
     import torch
     from torch.utils.data import Dataset, DataLoader
     from transformers import BertTokenizer, BertForQuestionAnswering, AdamW
     from sklearn.model_selection import train_test_split
     from tqdm import tqdm
     from nltk.translate.bleu_score import sentence_bleu
     import nltk
     # Download NLTK data for BLEU score calculation
     nltk.download('punkt')
     #Ignore Warnings
     import logging
     logging.disable(logging.WARNING)
     [nltk_data] Downloading package punkt to /root/nltk_data...
     [nltk_data] Unzipping tokenizers/punkt.zip.
    ##Load Dataset and Process Dataset
[2]: # Load CoQA dataset
     def load_coqa_data(file_path):
         with open(file_path, 'r') as f:
              data = json.load(f)
         return data['data']
     # Custom dataset class
     class CoQADataset(Dataset):
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self.data = data
     self.tokenizer = tokenizer
     self.max_length = max_length
def __len__(self):
     return len(self.data)
def __getitem__(self, idx):
     item = self.data[idx]
     context = item['story']
     question = item['questions'][0]['input text']
     answer = item['answers'][0]['input_text']
     # Tokenize the input
     inputs = self.tokenizer.encode plus(
         question,
          context,
          add special tokens=True,
          max_length=self.max_length,
          padding='max length',
         truncation=True,
         return tensors='pt'
     )
     # Find the start and end positions of the answer in the tokenized input input ids =
     inputs['input ids'][0]
     answer tokens = self.tokenizer.encode(answer, add special tokens=False)
     start_position = None
     end position = None
     for i in range(len(input ids) - len(answer tokens) + 1):
          if input_ids[i:i+len(answer_tokens)].tolist() == answer_tokens:
              start position = i
              end position = i + len(answer tokens) - 1
              break
     # If the answer is not found, use the CLS token position as a default if
     start position is None:
          start position = 0
          end_position = 0
     return {
          'input_ids': inputs['input_ids'].flatten(),
                       'attention_mask': inputs['attention_mask'].flatten(),
          'start positions': torch.tensor(start position),
          'end positions': torch.tensor(end position),
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                    'answer': answer
              }
    0.0.1 Train, Validation and Test Split
[3]: from google.colab import drive
     drive.mount('/content/drive')
    Mounted at /content/drive
[4]: data = load_coqa_data('/content/drive/MyDrive/Colab Notebooks/NLP Lab _
       -Assignment-5/coga-train-v1.0.json')
     train_data, test_data = train_test_split(data, test_size=0.3, random_state=42) val_data,
     test_data = train_test_split(test_data, test_size=0.5, _ -random_state=42)
    ###Tokenization and DataLoader
[5]: # Initialize tokenizer and model
     tokenizer = BertTokenizer.from pretrained('bert-base-uncased')
     # Prepare datasets and dataloaders
     train_dataset = CoQADataset(train_data, tokenizer)
     val dataset = CoQADataset(val data, tokenizer)
     test_dataset = CoQADataset(test_data, tokenizer)
     train_loader = DataLoader(train_dataset, batch_size=8, shuffle=True) val_loader
     = DataLoader(val dataset, batch size=8)
     test_loader = DataLoader(test_dataset, batch_size=8)
    /usr/local/lib/python3.10/dist-packages/huggingface_hub/utils/_token.py:89:
    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 restart your
    session.
    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: 0%| | 0.00/48.0 [00:00<?, ?B/s] vocab.txt: 0%| |
    0.00/232k [00:00<?, ?B/s]
```

tokenizer.json: 0%| | 0.00/466k [00:00<?, ?B/s]

config.json: 0%| | 0.00/570 [00:00<?, ?B/s]

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/usr/local/lib/python3.10/dist
    packages/transformers/tokenization_utils_base.py:1601: FutureWarning:
     'clean up tokenization spaces' was not set. It will be set to 'True' by default. This behavior
    will be depracted in transformers v4.45, and will be then set to `False` by default. For more
    details check this issue:
    https://github.com/huggingface/transformers/issues/31884
       warnings.warn(
    ##Training Function
[6]: # Training function
     def train(model, train_loader, optimizer, device):
          model.train()
          total_loss = 0
          progress_bar = tqdm(train_loader, desc="Training")
          for batch in progress_bar:
               optimizer.zero_grad()
               input ids = batch['input ids'].to(device)
               attention_mask = batch['attention_mask'].to(device)
               start positions = batch['start positions'].to(device)
               end_positions = batch['end_positions'].to(device)
                  outputs = model(input_ids, attention_mask=attention_mask, _
       -start_positions=start_positions, end_positions=end_positions)
               loss = outputs.loss
               total_loss += loss.item()
               loss.backward()
               optimizer.step()
               progress_bar.set_postfix({'loss': loss.item()})
          return total_loss / len(train_loader)
     ###Model Initialization
[7]: model = BertForQuestionAnswering.from_pretrained('bert-base-uncased')
     # Set device and move model to device
     device = torch.device('cuda' if torch.cuda.is_available() else 'cpu')
     model.to(device)
     # Set optimizer
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optimizer = AdamW(model.parameters(), Ir=5e-5)
    model.safetensors: 0%| | 0.00/440M [00:00<?, ?B/s]
    /usr/local/lib/python3.10/dist-packages/transformers/optimization.py:591: 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
       warnings.warn(
    ##Validation
[8]: # Validation function
     def validate(model, val_loader, device):
          model.eval()
          total loss = 0
          progress_bar = tqdm(val_loader, desc="Validating")
          with torch.no_grad():
               for batch in progress bar:
                    input_ids = batch['input_ids'].to(device)
                             attention mask = batch['attention mask'].to(device)
                                start positions = batch['start positions'].to(device)
                    end positions = batch['end positions'].to(device)
                          outputs = model(input_ids, attention_mask=attention_mask,__
       -start positions=start positions, end positions=end positions)
                    loss = outputs.loss
                   total_loss += loss.item()
                    progress_bar.set_postfix({'loss': loss.item()})
          return total_loss / len(val_loader)
    ##Test
[9]: # Test function
     def test(model, test_loader, tokenizer, device):
          model.eval()
          all predictions = []
          all answers = []
          progress_bar = tqdm(test_loader, desc="Testing")
          with torch.no_grad():
               for batch in progress bar:
                    input_ids = batch['input_ids'].to(device)
                             attention mask = batch['attention mask'].to(device)
                    answers = batch['answer']
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outputs = model(input_ids, attention_mask=attention_mask)
                     start scores = outputs.start logits
                     end scores = outputs.end logits
                     for i in range(input ids.shape[0]):
                                                      5
                                  start index = torch.argmax(start scores[i])
                          end_index = torch.argmax(end_scores[i])
                                      prediction = tokenizer.decode(input ids[i][start index:
        →end_index+1])
                          all predictions.append(prediction)
                          all_answers.append(answers[i])
           bleu_score = calculate_bleu(all_predictions, all_answers)
           return bleu_score
[10]: # Training loop
      num epochs = 3
      best_loss = float('inf')
      for epoch in range(num epochs):
           print(f"Epoch {epoch + 1}/{num_epochs}")
           train_loss = train(model, train_loader, optimizer, device)
           val loss = validate(model, val loader, device)
           print(f"Train Loss: {train_loss:.4f}, Validation Loss: {val_loss:.4f}") if val_loss <
           best loss:
                best loss = val loss
                torch.save(model.state_dict(), 'bert_qa_model.pth')
                print("Model saved!")
           else:
                print("Validation Loss Increased. Model Not Saved.")
           print("*" * 50)
      Epoch 1/3
      Training: 100%|| 630/630 [08:58<00:00, 1.17it/s, loss=2.03] Validating: 100%||
      135/135 [00:39<00:00, 3.42it/s, loss=1.91]
      Train Loss: 2.5898, Validation Loss: 1.9448
      Model saved!
      Epoch 2/3
      Training: 100%|| 630/630 [09:02<00:00, 1.16it/s, loss=0.821] Validating: 100%||
      135/135 [00:39<00:00, 3.43it/s, loss=2.01]
      Train Loss: 1.3057, Validation Loss: 1.9789
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Validation Loss Increased, Model Not Saved.
      ***************
     Epoch 3/3
     Training: 100%|| 630/630 [09:01<00:00, 1.16it/s, loss=0.274] Validating: 100%||
     135/135 [00:39<00:00, 3.43it/s, loss=2.21]
     Train Loss: 0.6708, Validation Loss: 2.3661
     Validation Loss Increased, Model Not Saved.
      ***************
                                                   6
     ##BLEU Score
[11]: # Calculate BLEU score
      def calculate_bleu(predictions, references):
           bleu scores = []
           for pred, ref in zip(predictions, references):
               bleu scores.append(sentence_bleu([ref.split()], pred.split())) return
           sum(bleu scores) / len(bleu scores)
[12]: # Test the model
      bleu_score = test(model, test_loader, tokenizer, device)
      print(f"BLEU Score: {bleu score:.4f}")
     Testing: 100%|| 135/135 [00:47<00:00, 2.86it/s]
     BLEU Score: 0.0128
     /usr/local/lib/python3.10/dist-packages/nltk/translate/bleu score.py:552: UserWarning:
     The hypothesis contains 0 counts of 2-gram overlaps.
     Therefore the BLEU score evaluates to 0, independently of
     how many N-gram overlaps of lower order it contains.
     Consider using lower n-gram order or use SmoothingFunction()
        warnings.warn( msg)
     /usr/local/lib/python3.10/dist-packages/nltk/translate/bleu score.py:552: UserWarning:
     The hypothesis contains 0 counts of 3-gram overlaps.
     Therefore the BLEU score evaluates to 0, independently of
     how many N-gram overlaps of lower order it contains.
     Consider using lower n-gram order or use SmoothingFunction()
        warnings.warn( msg)
     /usr/local/lib/python3.10/dist-packages/nltk/translate/bleu score.py:552: UserWarning:
     The hypothesis contains 0 counts of 4-gram overlaps.
     Therefore the BLEU score evaluates to 0, independently of
     how many N-gram overlaps of lower order it contains.
     Consider using lower n-gram order or use SmoothingFunction()
        warnings.warn(_msg)
     ##Simple QA Bot
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[13]: # Create a simple QA bot
    def qa_bot(context, question):
        inputs = tokenizer.encode_plus(question, context, return_tensors='pt') input_ids =
        inputs['input_ids'].to(device)
        attention_mask = inputs['attention_mask'].to(device)

with torch.no_grad():
        outputs = model(input_ids, attention_mask=attention_mask)
        start_scores = outputs.start_logits
        end_scores = outputs.end_logits

start_index = torch.argmax(start_scores)
    end_index = torch.argmax(end_scores)
    answer = tokenizer.decode(input_ids[0][start_index:end_index+1])
    return answer
```

that Napoleon was a major influence. The French had used the right since at least the late 18th century. Some say that before the French Revolution, noblemen drove their carriages on the left, forcing the peasants to the right. Regardless of the origin, Napoleon brought right-hand traffic to the nations he conquered, including Russia, Switzerland and Germany. Hitler, in turn, ordered right-hand traffic in Czechoslovakia and Austria in the 1930s. Nations that escaped right-hand control, like Great Britain, followed their left-hand tradition. \n\nThe U.S. has not always been a nation of right-hand rivers; earlier in its history, carriage and horse traffic traveled on the left, as it did in England. But by the late 1700s, people driving large wagons pulled by several pairs of horses began promoting a shift to the right. A driver would sit on the rear left horse in order to wave his whip with his right hand; to see opposite traffic clearly, they traveled on the right. \n\nOne of the final moves to firmly standardize traffic directions in the U.S. occurred in the 20th century, when Henry Ford decided to mass-produce his cars with controls on the left (one reason, stated in 1908; the convenience for passengers exiting directly

onto the edge, especially... if there is a lady to be considered). Once these rules were set, many countries eventually adjusted to the right-hand standard, including Canada in the 1920s, Sweden in 1967 and Burma in 1970. The U.K. and former colonies such as Australia and India are among the western world's few remaining holdouts. Several Asian countries, including Japan, use the left as well -- thought many places use both right-hand-drive and left-hand drive

[17]: "Why does most of the world travel on the right side today? Theories differ, but there's no doubt

[17]: test\_data[0]['story']

cars."

Question: When did French started using the right side? Answer: the late 18th century

8 [19]: print("\*" \* 50) \*\*\*\*\*\*\*\*\*\*\*\*\*\* [20]: # Example 2 usage of the QA bot context = test\_data[0]['story'] question = "Who brought right handed driving to Austria?" answer = ga bot(context, question) print(f"Question: {question}") print(f"Answer: {answer}") Question: Who brought right handed driving to Austria? Answer: hitler [21]: print("\*" \* 50) [25]: !pip install --upgrade gradio import gradio as gr from transformers import pipeline # Load models for Q&A inference qa\_models = { "DistilBERT": pipeline("question-answering", \_\_ -model="distilbert-base-uncased-distilled-squad"), "BERT": pipeline("question-answering", \_\_ -model="bert-large-uncased-whole-word-masking-finetuned-squad"), "RoBERTa": pipeline("question-answering", model="deepset/ ⊸roberta-base-squad2") } # Define the inference function def answer\_question(model\_name, article, question): model = qa\_models[model\_name] result = model(question=question, context=article)

return result["answer"]

```
# Set up the Gradio interface
# Use gr.Dropdown instead of gr.inputs.Dropdown
model selection = gr.Dropdown(list(ga models.keys()), label="Select Model") article textbox
= gr.Textbox(lines=7, placeholder="Enter the article here...", __ \( \) label="Article")
label="Question")
answer textbox = gr.Textbox(label="Answer")
                                              9
# Build and launch the Gradio interface
gr.Interface(
     fn=answer question,
     inputs=[model_selection, article_textbox, question_textbox],
     outputs=answer textbox,
     title="Question Answering UI",
     description="Select a model, enter an article and a question to get an __ answer."
 ).launch()
Requirement already satisfied: gradio in /usr/local/lib/python3.10/dist-packages (5.4.0)
Requirement already satisfied: aiofiles<24.0,>=22.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (23.2.1)
Requirement already satisfied: anyio<5.0,>=3.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (3.7.1)
Requirement already satisfied: fastapi<1.0,>=0.115.2 in
/usr/local/lib/python3.10/dist-packages (from gradio) (0.115.3) Requirement already satisfied:
ffmpy in /usr/local/lib/python3.10/dist-packages (from gradio) (0.4.0)
Requirement already satisfied: gradio-client==1.4.2 in
/usr/local/lib/python3.10/dist-packages (from gradio) (1.4.2) Requirement already satisfied:
httpx>=0.24.1 in /usr/local/lib/python3.10/dist packages (from gradio) (0.27.2)
Requirement already satisfied: huggingface-hub>=0.25.1 in
/usr/local/lib/python3.10/dist-packages (from gradio) (0.26.1) Requirement already
satisfied: jinja2<4.0 in /usr/local/lib/python3.10/dist packages (from gradio) (3.1.4)
Requirement already satisfied: markupsafe~=2.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (2.1.5)
Requirement already satisfied: numpy<3.0,>=1.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (1.26.4) Requirement already
satisfied: orjson~=3.0 in /usr/local/lib/python3.10/dist packages (from gradio) (3.10.10)
Requirement already satisfied: packaging in /usr/local/lib/python3.10/dist packages (from
gradio) (24.1)
Requirement already satisfied: pandas<3.0,>=1.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (2.2.2)
Requirement already satisfied: pillow<12.0,>=8.0 in
/usr/local/lib/python3.10/dist-packages (from gradio) (10.4.0) Requirement already satisfied:
pydantic>=2.0 in /usr/local/lib/python3.10/dist packages (from gradio) (2.9.2)
Requirement already satisfied: pydub in /usr/local/lib/python3.10/dist-packages (from gradio)
(0.25.1)
```

Requirement already satisfied: python-multipart==0.0.12 in /usr/local/lib/python3.10/dist-packages (from gradio) (0.0.12) 10

Requirement already satisfied: pyyaml<7.0,>=5.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (6.0.2) Requirement already satisfied:

ruff>=0.2.2 in /usr/local/lib/python3.10/dist packages (from gradio) (0.7.1)

Requirement already satisfied: safehttpx<1.0,>=0.1.1 in

/usr/local/lib/python3.10/dist-packages (from gradio) (0.1.1)

Requirement already satisfied: semantic-version~=2.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (2.10.0)

Requirement already satisfied: starlette<1.0,>=0.40.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (0.41.0)

Requirement already satisfied: tomlkit==0.12.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (0.12.0)

Requirement already satisfied: typer<1.0,>=0.12 in

/usr/local/lib/python3.10/dist-packages (from gradio) (0.12.5)

Requirement already satisfied: typing-extensions~=4.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (4.12.2)

Requirement already satisfied: uvicorn>=0.14.0 in

/usr/local/lib/python3.10/dist-packages (from gradio) (0.32.0) Requirement already satisfied:

fsspec in /usr/local/lib/python3.10/dist-packages (from gradio-client==1.4.2->gradio) (2024.6.1)

Requirement already satisfied: websockets<13.0,>=10.0 in

/usr/local/lib/python3.10/dist-packages (from gradio-client==1.4.2->gradio) (12.0)

Requirement already satisfied: idna>=2.8 in /usr/local/lib/python3.10/dist packages (from anyio<5.0,>=3.0->gradio) (3.10)

Requirement already satisfied: sniffio>=1.1 in /usr/local/lib/python3.10/dist packages (from anyio<5.0,>=3.0->gradio) (1.3.1)

Requirement already satisfied: exceptiongroup in /usr/local/lib/python3.10/dist packages (from anyio<5.0,>=3.0->gradio) (1.2.2)

Requirement already satisfied: certifi in /usr/local/lib/python3.10/dist packages (from httpx>=0.24.1->gradio) (2024.8.30)

Requirement already satisfied: httpcore==1.\* in /usr/local/lib/python3.10/dist packages (from httpx>=0.24.1->gradio) (1.0.6)

Requirement already satisfied: h11<0.15,>=0.13 in

/usr/local/lib/python3.10/dist-packages (from

httpcore==1.\*->httpx>=0.24.1->gradio) (0.14.0)

Requirement already satisfied: filelock in /usr/local/lib/python3.10/dist packages (from

huggingface-hub>=0.25.1->gradio) (3.16.1)

Requirement already satisfied: requests in /usr/local/lib/python3.10/dist packages (from huggingface-hub>=0.25.1->gradio) (2.32.3)

Requirement already satisfied: tqdm>=4.42.1 in /usr/local/lib/python3.10/dist packages (from huggingface-hub>=0.25.1->gradio) (4.66.5)

Requirement already satisfied: python-dateutil>=2.8.2 in

/usr/local/lib/python3.10/dist-packages (from pandas<3.0,>=1.0->gradio) (2.8.2) Requirement already satisfied: pytz>=2020.1 in /usr/local/lib/python3.10/dist packages (from pandas<3.0,>=1.0->gradio) (2024.2)

Requirement already satisfied: tzdata>=2022.7 in /usr/local/lib/python3.10/dist packages (from pandas<3.0,>=1.0->gradio) (2024.2)

Requirement already satisfied: annotated-types>=0.6.0 in

/usr/local/lib/python3.10/dist-packages (from pydantic>=2.0->gradio) (0.7.0) Requirement already satisfied: pydantic-core==2.23.4 in

/usr/local/lib/python3.10/dist-packages (from pydantic>=2.0->gradio) (2.23.4) Requirement already satisfied: click>=8.0.0 in /usr/local/lib/python3.10/dist packages (from

typer<1.0,>=0.12->gradio) (8.1.7)

Requirement already satisfied: shellingham>=1.3.0 in

/usr/local/lib/python3.10/dist-packages (from typer<1.0,>=0.12->gradio) (1.5.4) Requirement already satisfied: rich>=10.11.0 in /usr/local/lib/python3.10/dist packages (from typer<1.0,>=0.12->gradio) (13.9.3)

Requirement already satisfied: six>=1.5 in /usr/local/lib/python3.10/dist packages (from python-dateutil>=2.8.2->pandas<3.0,>=1.0->gradio) (1.16.0) Requirement already

satisfied: markdown-it-py>=2.2.0 in

/usr/local/lib/python3.10/dist-packages (from

rich>=10.11.0->typer<1.0,>=0.12->gradio) (3.0.0)

Requirement already satisfied: pygments<3.0.0,>=2.13.0 in

/usr/local/lib/python3.10/dist-packages (from

rich>=10.11.0->typer<1.0,>=0.12->gradio) (2.18.0)

Requirement already satisfied: charset-normalizer<4,>=2 in

/usr/local/lib/python3.10/dist-packages (from requests->huggingface

hub>=0.25.1->gradio) (3.4.0)

Requirement already satisfied: urllib3<3,>=1.21.1 in

/usr/local/lib/python3.10/dist-packages (from requests->huggingface

hub>=0.25.1->gradio) (2.2.3)

Requirement already satisfied: mdurl~=0.1 in /usr/local/lib/python3.10/dist packages (from markdown-it-py>=2.2.0->rich>=10.11.0->typer<1.0,>=0.12->gradio) (0.1.2)

/usr/local/lib/python3.10/dist

packages/transformers/tokenization\_utils\_base.py:1601: FutureWarning:

'clean\_up\_tokenization\_spaces' was not set. It will be set to 'True' by default. This behavior will be depracted in transformers v4.45, and will be then set to 'False' by default. For more details check this issue:

https://github.com/huggingface/transformers/issues/31884 warnings.warn(

Running Gradio in a Colab notebook requires sharing enabled. Automatically setting `share=True` (you can turn this off by setting `share=False` in `launch()` explicitly).

Colab notebook detected. To show errors in colab notebook, set debug=True in launch() \* Running on public URL: https://6a68d565d19d963fed.gradio.live

This share link expires in 72 hours. For free permanent hosting and GPU upgrades, run 'gradio deploy' from the terminal in the working directory to deploy to Hugging Face Spaces (https://huggingface.co/spaces)

<IPython.core.display.HTML object>

[25]:

[26]: !apt-get install texlive texlive-xetex texlive-latex-extra pandoc

!pip install pypandoc

[29]: !jupyter nbconvert --to PDF "drive/My drive/Colab Notebooks/NLP Lab \_\_

--Assignment-5/Question\_Answering.ipynb"

[NbConvertApp] WARNING | pattern 'drive/My drive/Colab Notebooks/NLP Lab Assignment-5/Question\_Answering.ipynb' matched no files
This application is used to convert notebook files (\*.ipynb) to various other formats.

WARNING: THE COMMANDLINE INTERFACE MAY CHANGE IN FUTURE RELEASES.

## Options

======

The options below are convenience aliases to configurable class-options, as listed in the "Equivalent to" description-line of the aliases. To see all configurable class-options for some <cmd>, use:

<cmd> --help-all

--debug

set log level to logging.DEBUG (maximize logging output)

Equivalent to: [--Application.log\_level=10]

--show-confia

Show the application's configuration (human-readable format)

Equivalent to: [--Application.show\_config=True]

--show-config-json

Show the application's configuration (json format)

Equivalent to: [--Application.show\_config\_json=True]

--generate-config

generate default config file

Equivalent to: [--JupyterApp.generate\_config=True]

-у

Answer yes to any questions instead of prompting.

Equivalent to: [--JupyterApp.answer\_yes=True]

--execute

Execute the notebook prior to export.

Equivalent to: [--ExecutePreprocessor.enabled=True]

--allow-errors

Continue notebook execution even if one of the cells throws an error and include the error message in the cell output (the default behaviour is to abort conversion). This flag is only relevant if '--execute' was specified, too. Equivalent to:

[--ExecutePreprocessor.allow\_errors=True]

--stdin

read a single notebook file from stdin. Write the resulting notebook with 13

default basename 'notebook.\*'

Equivalent to: [--NbConvertApp.from\_stdin=True]

--stdout

Write notebook output to stdout instead of files.

Equivalent to: [--NbConvertApp.writer class=StdoutWriter]

--inplace

Run nbconvert in place, overwriting the existing notebook (only relevant when converting to notebook format)

Equivalent to: [--NbConvertApp.use output suffix=False

- --NbConvertApp.export format=notebook --FilesWriter.build directory=]
- --clear-output

Clear output of current file and save in place.

overwriting the existing notebook.

Equivalent to: [--NbConvertApp.use output suffix=False

- --NbConvertApp.export\_format=notebook --FilesWriter.build\_directory=
- --ClearOutputPreprocessor.enabled=True]
- --no-prompt

Exclude input and output prompts from converted document.

Equivalent to: [--TemplateExporter.exclude\_input\_prompt=True

- --TemplateExporter.exclude\_output\_prompt=True]
- --no-input

Exclude input cells and output prompts from converted document. This mode is ideal for generating code-free reports.

Equivalent to: [--TemplateExporter.exclude output prompt=True

- --TemplateExporter.exclude input=True
- --TemplateExporter.exclude input prompt=True]
- --allow-chromium-download

Whether to allow downloading chromium if no suitable version is found on the system.

Equivalent to: [--WebPDFExporter.allow chromium download=True]

--disable-chromium-sandbox

Disable chromium security sandbox when converting to PDF..

Equivalent to: [--WebPDFExporter.disable\_sandbox=True]

--show-input

Shows code input. This flag is only useful for dejavu users.

Equivalent to: [--TemplateExporter.exclude\_input=False]

## --embed-images Embed the images as base64 dataurls in the output. This flag is only useful for the HTML/WebPDF/Slides exports. Equivalent to: [--HTMLExporter.embed images=True] --sanitize-html Whether the HTML in Markdown cells and cell outputs should be sanitized... Equivalent to: [--HTMLExporter.sanitize html=True] --log-level=<Enum> Set the log level by value or name. Choices: any of [0, 10, 20, 30, 40, 50, 'DEBUG', 'INFO', 'WARN', 'ERROR', 'CRITICAL'] Default: 30 14 Equivalent to: [--Application.log level] --config=<Unicode> Full path of a config file. Default: " Equivalent to: [--JupyterApp.config file] --to=<Unicode> The export format to be used, either one of the built-in formats ['asciidoc', 'custom', 'html', 'latex', 'markdown', 'notebook', 'pdf', 'python', 'rst', 'script', 'slides', 'webpdf'] or a dotted object name that represents the import path for an ``Exporter`` class Default: " Equivalent to: [--NbConvertApp.export format] --template=<Unicode> Name of the template to use Default: " Equivalent to: [--TemplateExporter.template\_name] --template-file=<Unicode> Name of the template file to use Default: None Equivalent to: [--TemplateExporter.template\_file] --theme=<Unicode> Template specific theme(e.g. the name of a JupyterLab CSS theme distributed as prebuilt extension for the lab template) Default: 'light' Equivalent to: [--HTMLExporter.theme] --sanitize html=<Bool> Whether the HTML in Markdown cells and cell outputs should be sanitized. This should be set to True by nbviewer or similar tools. Default: False Equivalent to: [--HTMLExporter.sanitize html] --writer=<DottedObjectName> Writer class used to write the

Default: 'FilesWriter'

results of the conversion

```
Equivalent to: [--NbConvertApp.writer_class]
--post=<DottedOrNone>
     PostProcessor class used to write the
                                                     results of the conversion
     Default: "
     Equivalent to: [--NbConvertApp.postprocessor_class]
--output=<Unicode>
    overwrite base name use for output files.
                           can only be used when converting one notebook at a time.
     Default: "
     Equivalent to: [--NbConvertApp.output_base]
--output-dir=<Unicode>
     Directory to write output(s) to. Defaults
                                               15
                                                  to output to the directory of each notebook.
To recover
                                                  previous default behaviour (outputting to the
current
                                                   working directory) use . as the flag value.
     Default: "
     Equivalent to: [--FilesWriter.build_directory]
--reveal-prefix=<Unicode>
    The URL prefix for reveal.js (version 3.x).
              This defaults to the reveal CDN, but can be any url pointing to a copy
              of reveal.is.
              For speaker notes to work, this must be a relative path to a local copy of
              reveal.js: e.g., "reveal.js".
              If a relative path is given, it must be a subdirectory of the current
              directory (from which the server is run).
              See the usage documentation
              (https://nbconvert.readthedocs.io/en/latest/usage.html#reveal-js
html-slideshow)
              for more details.
     Default: "
     Equivalent to: [--SlidesExporter.reveal_url_prefix]
--nbformat=<Enum>
     The nbformat version to write.
              Use this to downgrade notebooks.
     Choices: any of [1, 2, 3, 4]
     Default: 4
     Equivalent to: [--NotebookExporter.nbformat_version]
Examples
```

The simplest way to use nbconvert is

> jupyter nbconvert mynotebook.ipynb --to html

Options include ['asciidoc', 'custom', 'html', 'latex', 'markdown', 'notebook', 'pdf', 'python', 'rst', 'script', 'slides', 'webpdf'].

> jupyter nbconvert --to latex mynotebook.ipynb

Both HTML and LaTeX support multiple output templates. LaTeX  $\,$ 

includes

'base', 'article' and 'report'. HTML includes 'basic', 'lab' and 'classic'. You can specify the flavor of the format used.

> jupyter nbconvert --to html --template lab mynotebook.ipynb 16

You can also pipe the output to stdout, rather than a file

> jupyter nbconvert mynotebook.ipynb --stdout

PDF is generated via latex

> jupyter nbconvert mynotebook.ipynb --to pdf

You can get (and serve) a Reveal.js-powered slideshow

> jupyter nbconvert myslides.ipynb --to slides --post serve

Multiple notebooks can be given at the command line in a couple of different ways:

> jupyter nbconvert notebook\*.ipynb

> jupyter nbconvert notebook1.ipynb notebook2.ipynb

or you can specify the notebooks list in a config file, containing::

c.NbConvertApp.notebooks = ["my\_notebook.ipynb"]

> jupyter nbconvert --config mycfg.py

To see all available configurables, use `--help-all`.

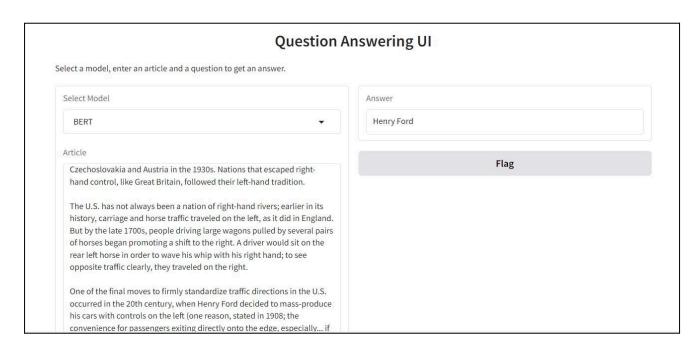


Fig. 1.: Gradio-based Question-Answering User Interface (UI)

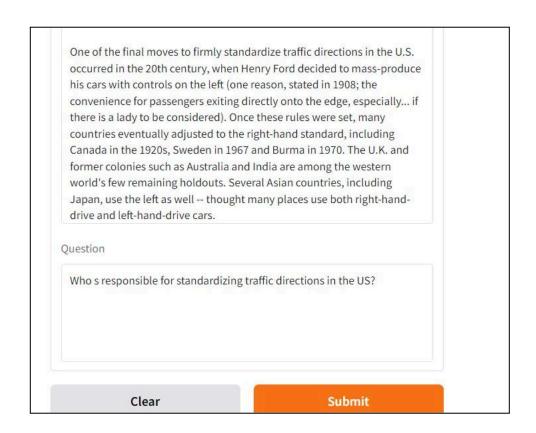


Fig. 2.: Gradio-based Question-Answering User Interface (UI)