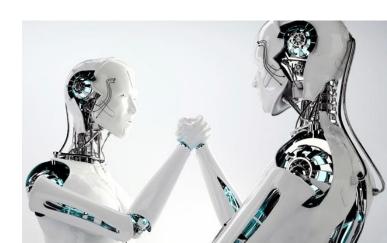
# Evaluating the Logical Coherence of Conversations between GPTs

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### Summary of Project

Step 1: Fine-tune a pre-trained conversational language model from Hugging Face on a desired dataset.

Step 2: Then, do the same, but on a second dataset that **differs fundamentally in content, quality, and/or length**.

Step 3: Generate a conversation between these two models by feeding one's output as the other's input, and so on.

Step 4: Evaluate the logical coherence of the resulting conversation.

Step 5: Repeat, using different datasets.

#### **Progress**

- Base model: <u>DialoGPT</u>, "a SOTA large-scale pretrained dialogue response generation model for multiturn conversations."
- Fine-tuned DialoGPT to create:
  - RandomGPT: trained on 10,000 sentences generated by randomly sampling words out of a dataset containing 370,105 English words.
  - StarWarsGPT: trained on every line of dialogue from Star Wars: Episodes IV-VI.
  - ShakespeareGPT: trained on "<u>Tiny Shakespeare</u>," 40,000 lines of dialogue from a variety of Shakespeare plays.
- Use GloVe embeddings to measure the average similarity score of a conversation.

### Example: StarWarsGPT with StarWarsGPT

```
>> Please input a prompt to get the conversation going: come on, we have to run!
StarWarsGPT-small (Model #1): I'm on it, boss!
StarWarsGPT-small (Model #2): We're on it!
StarWarsGPT-small (Model #1): That's it! Chewie, pull up!
StarWarsGPT-small (Model #2): Oh, no!
StarWarsGPT-small (Model #1): Get up! We're coming in much faster this time.
StarWarsGPT-small (Model #2): We've got to get out of here quick.
StarWarsGPT-small (Model #1): I've got a bad feeling about this.
StarWarsGPT-small (Model #2): !!!
StarWarsGPT-small (Model #1): !
StarWarsGPT-small (Model #2): Good shot, kid.
                                                           DEGE
Average similarity score: 0.8017039924860001
```

### Example: ShakespeareGPT with ShakespeareGPT

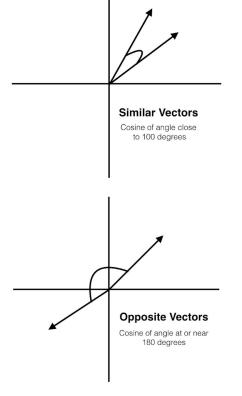
```
>> Please input a prompt to get the conversation going: come on, we have to run!
ShakespeareGPT-small (Model #1): Go, go, go with us; we must go with you.
ShakespeareGPT-small (Model #2): Go with me, and let me see them.
ShakespeareGPT-small (Model #1): I will not.
ShakespeareGPT-small (Model #2): Come, go.
ShakespeareGPT-small (Model #1): Do not look to the sky.
ShakespeareGPT-small (Model #2): It is the wind that blows so wildly.
ShakespeareGPT-small (Model #1): !!!?!!
ShakespeareGPT-small (Model #2): !??!?
ShakespeareGPT-small (Model #1): !,!!,?!,,!,.!!.!,'!!'!?,!?.!?'!,!'!!!'!?!'!,
ShakespeareGPT-small (Model #2): !.,!.
Average similarity score: 0.8953382670879364
```

# Example: StarWarsGPT with ShakespeareGPT

```
>> Please input a prompt to get the conversation going: come on, we have to run!
StarWarsGPT-small (Model #1): Yes, sir.
ShakespeareGPT-small (Model #2): Come on, I say.
StarWarsGPT-small (Model #1): Oh, my.
ShakespeareGPT-small (Model #2): 'Tis no time to jest now, I warrant you.
StarWarsGPT-small (Model #1): What's so funny?
ShakespeareGPT-small (Model #2): The humour is gone, sir, for now.
StarWarsGPT-small (Model #1): !!!?!!
ShakespeareGPT-small (Model #2): !?
StarWarsGPT-small (Model #1): !
ShakespeareGPT-small (Model #2): ?!??!
Average similarity score: 0.7754686375459036
```

# Evaluation by Averaging Similarity Scores of Sentences

```
def average similarity score(sentence list):
    # Compute similarity score between each pair of adjacent sentences in the list and return their average
    similarity scores = []
    # Iterate through adjacent sentence pairs
    for i in range(len(sentence list) - 1):
        sentence1 = sentence list[i]
        sentence2 = sentence list[i + 1]
        # Preprocess and tokenize sentences
        tokens1 = word tokenize(sentence1.lower())
        tokens2 = word tokenize(sentence2.lower())
        # Get glove word embeddings for each token
        sentence1 embeddings = [glove[token] for token in tokens1 if token in glove.stoi]
        sentence2 embeddings = [glove[token] for token in tokens2 if token in glove.stoi]
        # Compute sentence embeddings by averaging word embeddings
        sentence1 embedding = torch.mean(torch.stack(sentence1 embeddings), dim=0)
        sentence2 embedding = torch.mean(torch.stack(sentence2 embeddings), dim=0)
        # Compute cosine similarity
        similarity = F.cosine similarity(sentence1 embedding.unsqueeze(0), sentence2 embedding.unsqueeze(0))
        similarity scores.append(similarity.item())
    # Calculate average similarity score
    average similarity = sum(similarity scores) / len(similarity scores)
    return average similarity
```



#### Next Steps

- Train additional models and evaluate conversations between them.
- Improve existing models by tweaking hyperparameters
- Experiment with <u>Coh-Metrix</u>, "which analyzes texts on over 200 measures of cohesion, language, and readability" as a better way of evaluating logical coherence
- In preparation for the final paper, achieve rigorous understanding of the mechanics behind pretrained, conversational models

#### Sources

#### Model training and fine-tuning:

- <a href="https://huggingface.co/microsoft/DialoGPT-small">https://huggingface.co/microsoft/DialoGPT-small</a>
- https://www.youtube.com/watch?v=eereDVZeE7Y
- https://github.com/MexJason/HubermanGPT
- <a href="https://nathancooper.io/i-am-a-nerd/chatbot/deep-learning/gpt2/2020/05/12/chatbot-part-1.html">https://nathancooper.io/i-am-a-nerd/chatbot/deep-learning/gpt2/2020/05/12/chatbot-part-1.html</a>

#### Data:

- <a href="https://www.kaggle.com/datasets/xvivancos/star-wars-movie-scripts">https://www.kaggle.com/datasets/xvivancos/star-wars-movie-scripts</a>
- https://raw.githubusercontent.com/karpathy/char-rnn/master/data/tinyshakespeare/input.txt
- <a href="https://github.com/dwyl/english-words/tree/master">https://github.com/dwyl/english-words/tree/master</a>