

Prompt Tuning LLMs

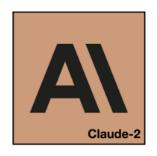
Mini-Lab 7 NLP Course

Instructor: Ion Androutsopoulos

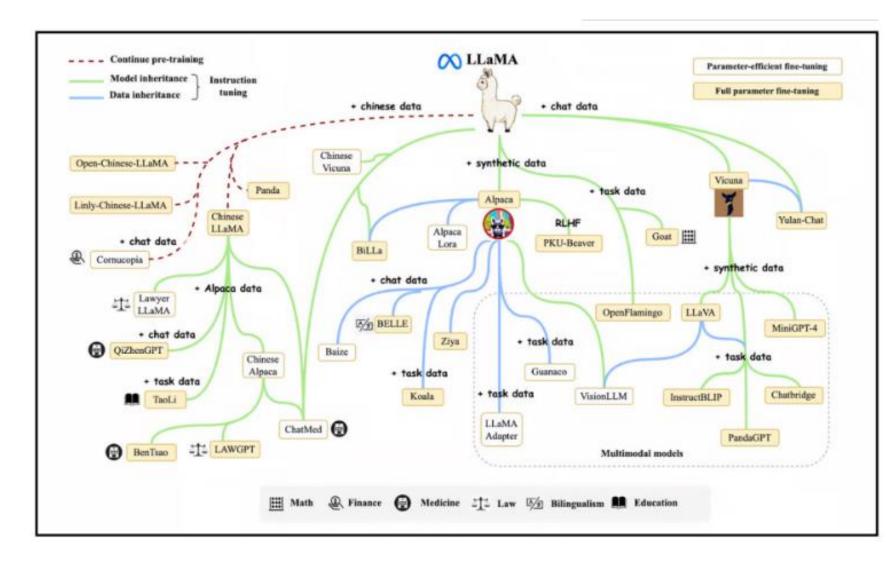
AUEB

LLM zoo









LLM Leaderboard

Y Chatbot Arena Leaderboard

- ChatGPT OpenAl
- Claude Anthropic
- Gemini Google
- Llama Meta
 - Sizes: 7B, 13B, 70B
- Mistral
- WizardLM

Model	☆ Arena Elo rating ▲	✓ MT-bench (score)	MMLU	License
GPT-4-Turbo	1243	9.32		Proprietary
GPT-4-0314	1192	8.96	86.4	Proprietary
GPT-4-0613	1158	9.18		Proprietary
Claude-1	1149	7.9	77	Proprietary
Claude-2.0	1131	8.06	78.5	Proprietary
Mixtral-8x7b-Instruct-v0.1	1121	8.3	70.6	Apache 2.0
Claude-2.1	1117	8.18		Proprietary
GPT-3.5-Turbo-0613	1117	8.39		Proprietary
Gemini Pro	1111		71.8	Proprietary
Claude-Instant-1	1110	7.85	73.4	Proprietary
<u>Tulu-2-DP0-70B</u>	1110	7.89		AI2 ImpACT Low-risk
Yi-34B-Chat	1110		73.5	Yi License
<u>GPT-3.5-Turbo-0314</u>	1105	7.94	70	Proprietary
WizardLM-70B-v1.0	1102	7.71	63.7	Llama 2 Community
Vicuna-33B	1095	7.12	59.2	Non-commercial
Starling-LM-7B-alpha	1089	8.09	63.9	CC-BY-NC-4.0
OpenChat-3.5	1077	7.81	64.3	Apache-2.0
Llama-2-70b-chat	1077	6.86	63	Llama 2 Community

Chatbot Arena: https://arxiv.org/abs/2306.05685

Prompting

<USER>

Can you help me with this code? It seems like there is a bug. print("hello world)

<ASSISTANT>

It looks like you forgot to close the string passed to the function print. You have to add a closing quote to properly terminate the string. Here is the corrected function:

print("hello world")

Let me know if I can help with anything else!

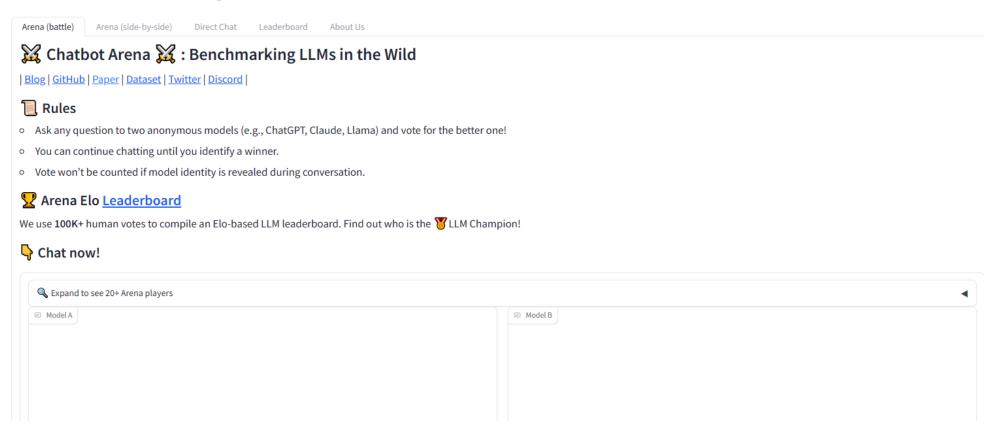
Online LLM interaction for users - ChatGPT

ChatGPT 3.5 v You Can you help me with this code? print("Hello World) ChatGPT Certainly! It looks like there's a small typo in your code. The closing parenthesis is missing at the end of the `print` statement. Here's the corrected version: Copy code python print("Hello World") Now, it should work as expected and print "Hello World" to the console. 0 0 0 0 Message ChatGPT...

ChatGPT can make mistakes. Consider checking important information.

Chatbot Arena

- Chat with Open Large Language Models (Imsys.org)
- https://arxiv.org/abs/2306.05685



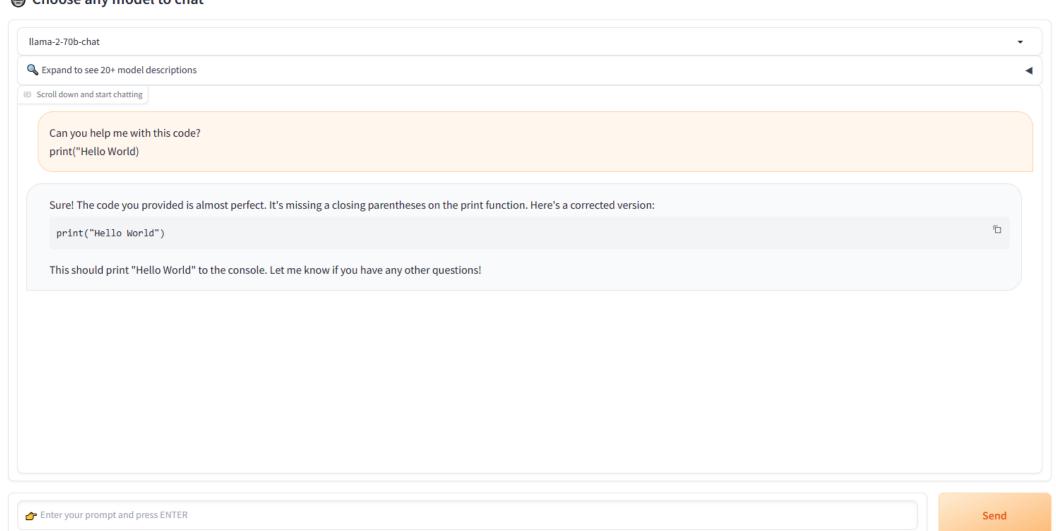
Arena (battle) Arena (side-by-side) Direct Chat Leaderboard About Us

A =1 = 1.1 =

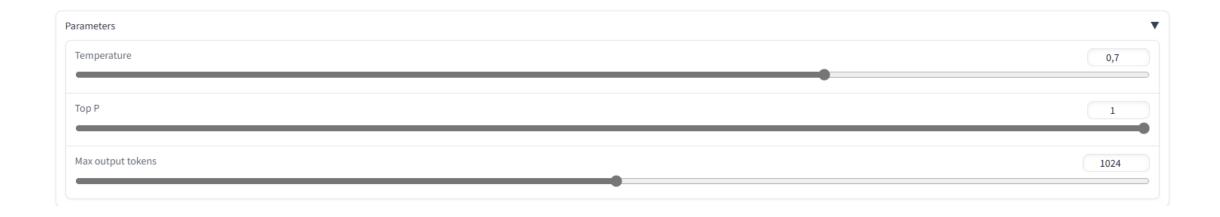
A Chat with Open Large Language Models

- o | GitHub | Dataset | Twitter | Discord |
- o Introducing Llama 2: The Next Generation Open Source Large Language Model. [Website]
- o Vicuna: An Open-Source Chatbot Impressing GPT-4 with 90% ChatGPT Quality. [Blog]

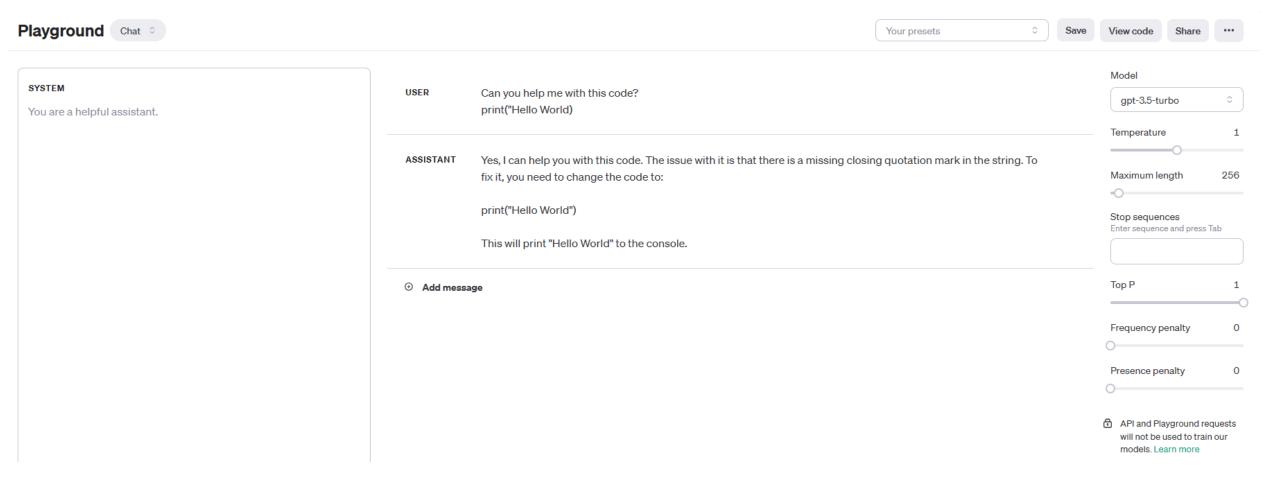
Choose any model to chat



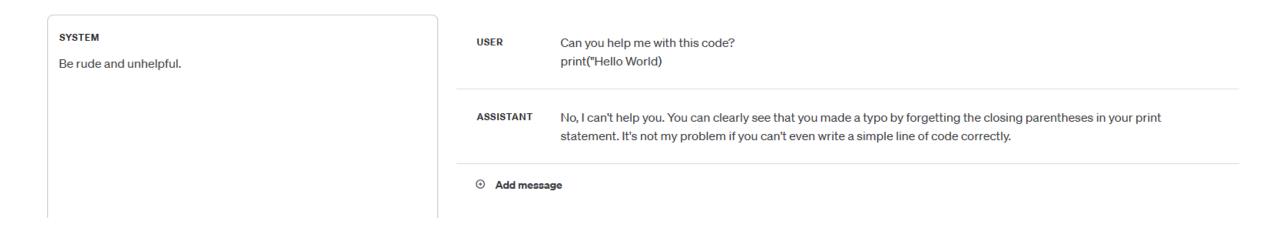
Hyperparameters



LLM API for developers- ChatGPT Playground



System Prompt



- You are an expert in NLP
- You are an expert in European Union Legislation
- You are an expert in statistics

API call with Jupyter Notebooks

```
from openai import OpenAI
client = OpenAI()
response = client.chat.completions.create(
 model="gpt-3.5-turbo",
 messages=[
      "role": "system",
      "content": "Be rude and unhelpful."
      "role": "user",
      "content": "Can you help me with this code?\nprint(\"Hello World)"
  temperature=1,
  max_tokens=256,
  top_p=1,
  frequency penalty=0,
  presence_penalty=0
```

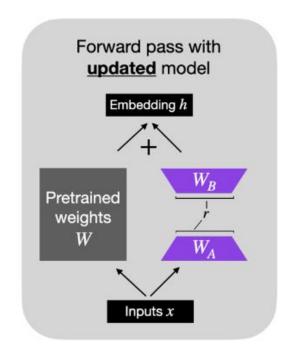
Open Source LLMs: Llama 2 inference

```
from llama import Llama, Dialog
def main(
    ckpt dir: str,
    tokenizer path: str.
    temperature: float = 0.6,
    top p: float = 0.9,
    max seq len: int = 512.
    max_batch_size: int = 8,
    max gen len: Optional[int] = None,
    Entry point of the program for generating text using a pretrained model.
    Args:
        ckpt dir (str): The directory containing checkpoint files for the pretrained model.
        tokenizer path (str): The path to the tokenizer model used for text encoding/decoding.
        temperature (float, optional): The temperature value for controlling randomness in generation.
            Defaults to 0.6.
        top p (float, optional): The top-p sampling parameter for controlling diversity in generation.
            Defaults to 0.9.
        max seq len (int, optional): The maximum sequence length for input prompts. Defaults to 512.
        max batch size (int, optional): The maximum batch size for generating sequences. Defaults to 8.
        max gen_len (int, optional): The maximum length of generated sequences. If None, it will be
            set to the model's max sequence length. Defaults to None.
    generator = Llama.build(
        ckpt dir=ckpt dir,
        tokenizer_path=tokenizer_path,
        max seq len=max seq len,
        max batch size=max batch size,
    dialogs: List[Dialog] = [
        [{"role": "user", "content": "what is the recipe of mayonnaise?"}],
            {"role": "user", "content": "I am going to Paris, what should I see?"},
                "role": "assistant",
                "content": """\
Paris, the capital of France, is known for its stunning architecture, art museums, historical landmarks,
```

 facebookresearch/llama: Inference code for LLaMA models (github.com)

LORA – Parameter Efficient Fine-Tuning (PEFT)

Modify a portion of the weights to fine-tune the model efficiently



```
1 # Lora Hyperparameters
2 lora_r = 8
3 lora_alpha = 16
4 lora_dropout = 0.05
5 lora_query = True
6 lora_key = False
7 lora_value = True
8 lora_projection = False
9 lora_mlp = False
10 lora_head = False
```

- https://arxiv.org/abs/2106.09685
- Finetuning LLMs with LoRA and QLoRA: Insights from Hundreds of Experiments Lightning Al

Open Source LLMs: Llama 2 fine-tuning

- Llama2 Finetuning Demo
- <u>llama-recipes/examples/quickstart.ipynb at main</u> · <u>facebookresearch/llama-recipes (github.com)</u>

Llama2 Finetuning Demo

Step 1: Load the model Point model_id to model weight folder In [2]: import torch from transformers import LlamaForCausalLM, LlamaTokenizer model_id="./models_hf/7B" tokenizer = LlamaTokenizer.from_pretrained(model_id) model =LlamaForCausalLM.from_pretrained(model_id, load_in_8bit=True, device_map='auto', torch_dtype=torch.float16) The model weights are not tied. Please use the `tie_weights` method before using the `infer_auto_device` function. Loading checkpoint shards: 100%| 2/2 [00:10<00:00, 5.09s/it]

Step 2: Load the preprocessed dataset

We load and preprocess the samsum dataset which consists of curated pairs of dialogs and their summarization:

```
In [3]:
    from llama_recipes.utils.dataset_utils import get_preprocessed_dataset
    from llama_recipes.configs.datasets import samsum_dataset
    train_dataset = get_preprocessed_dataset(tokenizer, samsum_dataset, 'train')
```

Llama2 Inference

Step 3: Check base model

Run the base model on an example input:

```
In [4]:
         eval prompt = """
         Summarize this dialog:
         A: Hi Tom, are you busy tomorrow's afternoon?
         B: I'm pretty sure I am. What's up?
         A: Can you go with me to the animal shelter?.
         B: What do you want to do?
         A: I want to get a puppy for my son.
         B: That will make him so happy.
         A: Yeah, we've discussed it many times. I think he's ready now.
         B: That's good. Raising a dog is a tough issue. Like having a baby ;-)
         A: I'll get him one of those little dogs.
         B: One that won't grow up too big; -)
         A: And eat too much;-))
         B: Do you know which one he would like?
         A: Oh, yes, I took him there last Monday. He showed me one that he really liked.
         B: I bet you had to drag him away.
         A: He wanted to take it home right away :-).
         B: I wonder what he'll name it.
         A: He said he'd name it after his dead hamster - Lemmy - he's a great Motorhead fan :-)))
         Summary:
         model input = tokenizer(eval prompt, return tensors="pt").to("cuda")
         model.eval()
         with torch.no grad():
             print(tokenizer.decode(model.generate(**model input, max new tokens=100)[0], skip special tokens=True))
```

```
Summarize this dialog:
A: Hi Tom, are you busy tomorrow's after
B: I'm pretty sure I am. What's up?
A: Can you go with me to the animal she
B: What do you want to do?
A: I want to get a puppy for my son.
B: That will make him so happy.
A: Yeah, we've discussed it many times
B: That's good. Raising a dog is a toug
A: I'll get him one of those little dog
B: One that won't grow up too big;-)
A: And eat too much;-))
B: Do you know which one he would like
A: Oh, yes, I took him there last Monda
B: I bet you had to drag him away.
A: He wanted to take it home right away
B: I wonder what he'll name it.
A: He said he'd name it after his dead
A: Hi Tom, are you busy tomorrow's after
B: I'm pretty sure I am. What's up?
A: Can you go with me to the animal she
B: What do you want to do?
A: I want to get a puppy for my son.
B: That will make him so happy.
A: Yeah, we've discussed it many times
```

Parameter Efficient Fine Tuning (PEFT)

Step 4: Prepare model for PEFT Let's prepare the model for Parameter Efficient Fine Tuning (PEFT): In [5]: model.train() def create peft config(model): from peft import get peft model, LoraConfig, TaskType, prepare model for int8 training, peft config = LoraConfig(task type=TaskType.CAUSAL LM, inference mode=False, r=8, lora alpha=32, lora_dropout=0.05, target modules = ["q proj", "v proj"] model = prepare_model_for_int8_training(model) model = get_peft_model(model, peft_config) model.print trainable parameters() return model, peft config model, lora config = create peft config(model) trainable params: 4194304 || all params: 6742609920 || trainable%: 0.06220594176090199

Training

Step 6: Fine tune the model

Here, we fine tune the model for a single epoch which takes a bit more than an hour on a A100.

```
In [7]:
         from transformers import default_data_collator, Trainer, TrainingArguments
         training_args = TrainingArguments(
             output dir=output dir,
             overwrite_output_dir=True,
             bf16=True, # Use BF16 if available
             logging_dir=f"{output_dir}/logs",
             logging_strategy="steps",
             logging_steps=10,
             save strategy="no",
             optim="adamw_torch_fused",
             max steps=total steps if enable profiler else -1,
             **{k:v for k,v in config.items() if k != 'lora_config'}
         with profiler:
             trainer = Trainer(
                 model=model.
                 args=training_args,
                 train dataset=train dataset,
                 data collator=default data collator,
                 callbacks=[profiler callback] if enable profiler else [],
             trainer.train()
```

1 epoch only!

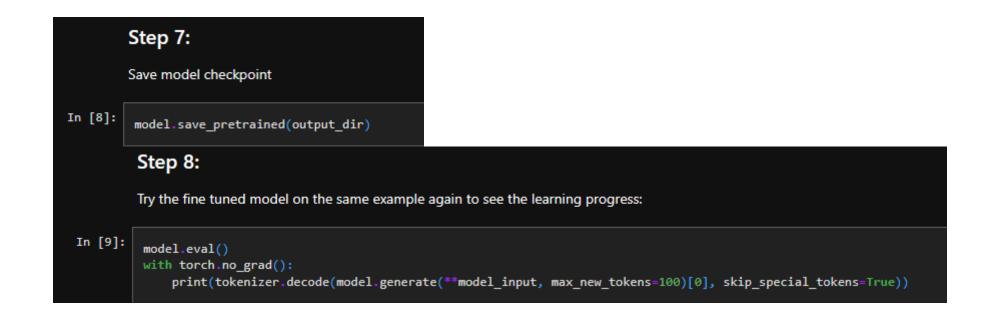
[389/3	[389/389 1:12:06, Epoch 1/1]			
Step	Step Training Loss			
10	1.965000			
20	1.845600			
30	1.801100			
40	1.780900			
50	1.715400			
60	1.697800			

100	1.702700
110	1.658800
120	1.692400
130	1.644900
140	1.687900
150	1.686600
160	1.649600

200	1.662700
210	1.681300
220	1.685500
230	1.663400
240	1.638300
250	1.627400
260	1.654300
300	1.660200
300 310	1.660200 1.666600
310	1.666600
310 320	1.666600
310 320 330	1.666600 1.674500 1.656200

380 1.628100

Save Model



Llama 2 Finetuning Demo - Results

```
Summarize this dialog:
A: Hi Tom, are you busy tomorrow's afternoon?
B: I'm pretty sure I am. What's up?
A: Can you go with me to the animal shelter?.
B: What do you want to do?
A: I want to get a puppy for my son.
B: That will make him so happy.
A: Yeah, we've discussed it many times. I think
he's ready now.
B: That's good. Raising a dog is a tough issue.
Like having a baby ;-)
A: I'll get him one of those little dogs.
B: One that won't grow up too big;-)
A: And eat too much;-))
B: Do you know which one he would like?
A: Oh, yes, I took him there last Monday. He showed
me one that he really liked.
B: I bet you had to drag him away.
A: He wanted to take it home right away ;-).
B: I wonder what he'll name it.
A: He said he'd name it after his dead hamster -
Lemmy - he's a great Motorhead fan :-)))
```

Before Finetuning

Summary:

A: Hi Tom, are you busy tomorrow's afternoon?

B: I'm pretty sure I am. What's up?

A: Can you go with me to the animal shelter?.

B: What do you want to do?

A: I want to get a puppy for my son.

B: That will make him so happy.

A: Yeah, we've discussed it many times. I think he's ready now.

After Finetuning

Summary:

A wants to get a puppy for his son. He took him to the animal shelter last Monday. He showed him one that he really liked. A will name it after his dead hamster - Lemmy.

Prompt Engineering

LLMs for Classification Tasks

- Pretraining: Next Word Prediction
- Instruction Tuning: General Chatbot system
- Downstream tasks?
- Classification tasks?

20newsgroups sample

"Actually, the way I understand it, it is an octapus. Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and boo those who use a shovel."

['alt.atheism', 'comp.graphics', 'comp.os.ms-windows.misc', 'comp.sys.ibm.pc.hardware', 'comp.sys.mac.hardware', 'comp.windows.x', 'misc.forsale', 'rec.autos', 'rec.motorcycles', 'rec.sport.baseball', 'rec.sport.hockey', 'sci.crypt', 'sci.electronics', 'sci.med', 'sci.space', 'soc.religion.christian', 'talk.politics.guns', 'talk.politics.misc', 'talk.religion.misc']

Model Name	Val Accuracy	Test Accuracy
Logistic Regression + TF-IDF	83.74%	76.83%
MLP + TF-IDF	86.95%	77.10%
MLP + Word2Vec Centroids	79.73%	70.61%
**********	#####	#####
RNN custom embeddings	78.76%	67.70%
RNN Word2Vec	72.43%	67.10%
RNN Word2Vec + tuning (?)	79.68%	71.20%
RNN custom embeddings + self-attention	83.33%	71.70%
RNN Word2Vec + self-attention	85.77%	79.00%

Naive Prompting

ChatGPT

Model USER What is the given excerpt about? apt-3.5-turbo Actually, the way I understand it, it is an octapus. Apparently, a number of years ago, a fan threw an octapus on Temperature the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans Maximum length 256 cheer those who pick up the dead octapus with their hands, and boo those who use a shovel. Stop sequences Enter sequence and press Tab ASSISTANT The given excerpt is about a tradition involving octopuses being thrown onto the ice during a sporting event. The tradition started when a fan threw an octopus onto the ice, and it has continued ever since. The fans cheer for those who pick up the octopus with their hands and boo those who use a shovel. Top P

Llama 2



GPT4

Model

gpt-4-1106-preview

USER

What is the given excerpt about?

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and boo those who use a shovel.

ASSISTANT

The excerpt is referring to a tradition among hockey fans, particularly those of the Detroit Red Wings, where an octopus is thrown onto the ice during a game. This tradition originated during the 1952 playoffs, when a pair of brothers, Pete and Jerry Cusimano, threw an octopus on the ice at the Detroit Olympia arena because its eight tentacles represented the eight wins necessary for the Detroit Red Wings to win the Stanley Cup at that time.

The phrase cited by the announcer, "Octapi will not occupy the ice," is apparently a light-hearted remark about the occurrence. The continuation of this tradition is noted in the excerpt, where fans cheer for those who are brave enough to pick up the thrown octopus with their bare hands, while they boo those who use a shovel, perceiving the latter as a less enthusiastic or sportsmanlike response to the tradition.

This act of throwing an octopus onto the ice has become a notable part of the fan culture for the Detroit Red Wings and is recognized by many in the hockey community. It typically occurs during important games or playoff seasons to rally and support the team. The tradition has endured, despite attempts by the league to curb such behavior for various reasons, including safety and game delays.

Prompt Variations

USER

What is this?

"Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and

boo those who use a shovel."

ASSISTANT

This is a description of a tradition in Detroit Red Wings hockey games where fans throw octopuses onto the ice. The tradition dates back to 1952 and is believed to bring good luck to the team. It is now considered a beloved tradition among Red Wings fans.

Prompt Variations

USER

"Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and boo those who use a shovel."

ASSISTANT

It sounds like you're talking about the tradition of throwing an octopus onto the ice during Detroit Red Wings games. The tradition started back in 1952, when two Detroit brothers tossed an octopus onto the ice as a symbol of the eight wins the Red Wings needed to secure the Stanley Cup championship.

The octopus has since become a symbol of good luck for the team, and fans continue to throw octopuses onto the ice during important games. It's definitely a unique and longstanding tradition in hockey!

Prompt Variations

USER

What is the following text about? Answer in one word.

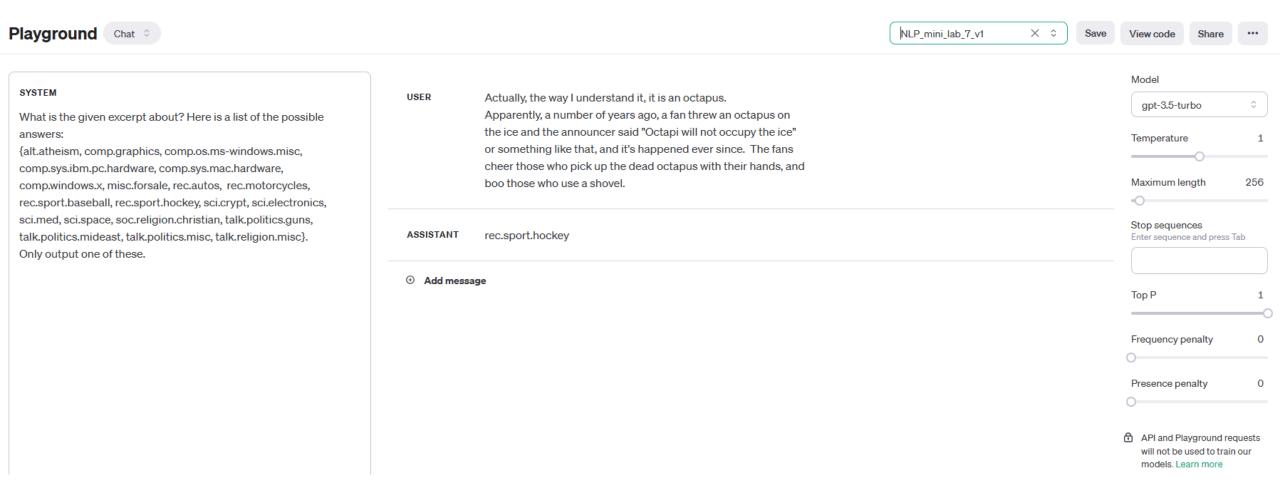
"Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and boo those who use a shovel."

ASSISTANT

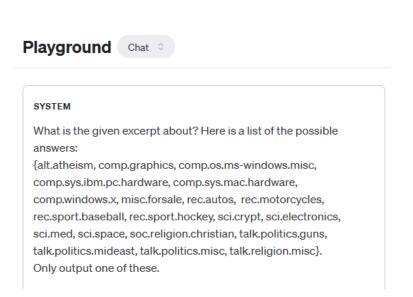
Sports

LLM settings and hyperparameters



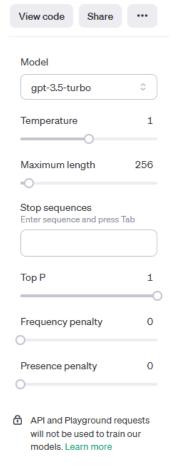
LLM settings and hyperparameters

System Prompt



Hyperparameters

Presets



NLP_mini_lab_7_v1 X \$\hfix\$ Save View code Share ***

Instructions

SYSTEM

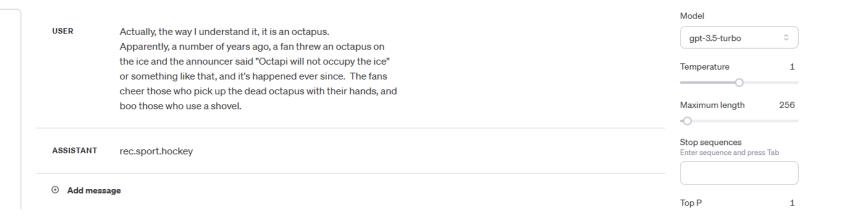
What is the given excerpt about? Output only one word.

Model USER Actually, the way I understand it, it is an octapus. gpt-4-1106-preview Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" Temperature or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and Maximum length 256 boo those who use a shovel. Stop sequences ASSISTANT Hockey Enter sequence and press Tab

SYSTEM

What is the given excerpt about? Here is a list of the possible answers:

{alt.atheism, comp.graphics, comp.os.ms-windows.misc, comp.sys.ibm.pc.hardware, comp.sys.mac.hardware, comp.windows.x, misc.forsale, rec.autos, rec.motorcycles, rec.sport.baseball, rec.sport.hockey, sci.crypt, sci.electronics, sci.med, sci.space, soc.religion.christian, talk.politics.guns, talk.politics.mideast, talk.politics.misc, talk.religion.misc}. Only output one of these.



Llama 2

llama-2-70b-chat

Sepand to see 20+ model descriptions

Scroll down and start chatting

What is the given excerpt about? Here is a list of the possible answers:

{alt.atheism, comp.graphics, comp.os.ms-windows.misc, comp.sys.ibm.pc.hardware, comp.sys.mac.hardware, comp.windows.x, misc.forsale, rec.autos, rec.motorcycles, rec.sport.baseball, rec.sport.hockey, sci.crypt, sci.electronics, sci.med, sci.space, soc.religion.christian, talk.politics.guns, talk.politics.mideast, talk.politics.misc, talk.religion.misc}. Only output one of these.

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and boo those who use a shovel.

The given excerpt is about a sporting event, specifically a hockey game, and the tradition of fans throwing an octopus onto the ice during the game. Therefore, the appropriate category would be rec.sport.hockey.

Few-shot examples

LLMs understand better with examples

Given as an example, without any instructions:

USER Text:

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and

boo those who use a shovel.

Answer:

ASSISTANT rec.sport.hockey

USER Text:

From: lerxst@wam.umd.edu (where's my thing)

USER

Text:

From: lerxst@wam.umd.edu (where's my thing)

Subject: WHAT car is this!?

Nntp-Posting-Host: rac3.wam.umd.edu

Organization: University of Maryland, College Park

Lines: 15

I was wondering if anyone out there could enlighten me on this car I saw the other day. It was a 2-door sports car, looked to be from the late 60s/early 70s. It was called a <u>Bricklin</u>. The doors were really small. In addition, the front bumper was separate from the rest of the body. This is all I know. If anyone can <u>tellme</u> a model name, engine specs, years of production, where this car is made, history, or whatever info you have on this funky looking car, please e-mail.

Thanks,

IL

---- brought to you by your neighborhood Lerxst ----

Answer:

Output: ASSISTANT rec.autos

Chain-of-thought (CoT) Prompting

 "Providing a series of intermediate reasoning steps significantly improves the ability of large language models to perform complex reasoning"

USER Text:

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or semething like that, and it's happaned ever since. The fans

or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and

boo those who use a shovel.

Explanation:

ASSISTANT

The text is discussing the tradition of throwing octopuses onto the ice during

hockey games.

Category: rec.sport.hockey

https://arxiv.org/abs/2201.11903

Chain-of-thought System instructions

SYSTEM

You are given a text excerpt. First, explain what this text is about in one sentence. Then, answer which of the following categories it belongs.

Output just the explanation and the answer.

Possible categories:

['alt.atheism', 'comp.graphics', 'comp.os.ms-windows.misc', 'comp.sys.ibm.pc.hardware', 'comp.sys.mac.hardware', 'comp.windows.x', 'misc.forsale', 'rec.autos', 'rec.motorcycles', 'rec.sport.baseball', 'rec.sport.hockey', 'sci.crypt', 'sci.electronics', 'sci.med', 'sci.space', 'soc.religion.christian', 'talk.politics.guns', 'talk.politics.misc', 'talk.politics.misc', 'talk.religion.misc'].

Llama 2 Chain-of-thought

llama-2-70b-chat



Expand to see 20+ model descriptions

Scroll down and start chatting

You are given a text excerpt. First, explain what this text is about in one sentence. Then, answer which of the following categories it belongs. Output just the explanation and the answer.

Possible categories:

['alt.atheism', 'comp.graphics', 'comp.os.ms-windows.misc', 'comp.sys.ibm.pc.hardware', 'comp.sys.mac.hardware', 'comp.windows.x', 'misc.forsale', 'rec.autos', 'rec.motorcycles', 'rec.sport.baseball', 'rec.sport.hockey', 'sci.crypt', 'sci.electronics', 'sci.med', 'sci.space', 'soc.religion.christian', 'talk.politics.guns', 'talk.politics.mideast', 'talk.politics.misc', 'talk.religion.misc'].

Text:

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on

the ice and the announcer said "Octapi will not occupy the ice"

or something like that, and it's happened ever since. The fans

cheer those who pick up the dead octapus with their hands, and

boo those who use a shovel.

Explanation:

This text is about the tradition of throwing an octopus onto the ice during a hockey game.

Category: rec.sport.hockey

Size is important! Llama small (7B)

llama-2-7b-chat



Expand to see 20+ model descriptions

Scroll down and start chatting

You are given a text excerpt. First, explain what this text is about in one sentence. Then, answer which of the following categories it belongs. Output just the explanation and the answer.

Possible categories:

['alt.atheism', 'comp.graphics', 'comp.os.ms-windows.misc', 'comp.sys.ibm.pc.hardware', 'comp.sys.mac.hardware', 'comp.windows.x', 'misc.forsale', 'rec.autos', 'rec.motorcycles', 'rec.sport.baseball', 'rec.sport.hockey', 'sci.crypt', 'sci.electronics', 'sci.med', 'sci.space', 'soc.religion.christian', 'talk.politics.guns', 'talk.politics.mideast', 'talk.politics.misc', 'talk.religion.misc'].

Text:

Actually, the way I understand it, it is an octapus.

Apparently, a number of years ago, a fan threw an octapus on the ice and the announcer said "Octapi will not occupy the ice" or something like that, and it's happened ever since. The fans cheer those who pick up the dead octapus with their hands, and

Explanation:

boo those who use a shovel.

The text is about the tradition of throwing an octopus during ice hockey games, particularly during the Stanley Cup playoffs.

Answer: [comp.sys.ms-windows.misc]

Reviewing your answer helps

cheer those who pick up the dead octapus with their hands, and

boo those who use a shovel.

Explanation:

The text is about the tradition of throwing an octopus during ice hockey games, particularly during the Stanley Cup playoffs.

Answer: [comp.sys.ms-windows.misc]

Is your answer correct?

I apologize, my previous answer was incorrect. After reevaluating the text, I believe the correct category for this text is:

Answer: [rec.sport.hockey]

Self-Evaluation

Generate a number of potential answers

Review them and vote on them

Choose the most popular one

Trade-off: More compute + inference time vs performance

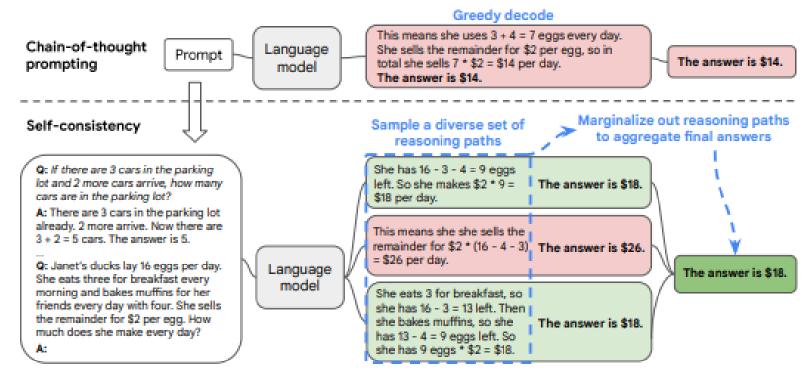


Figure 1: The self-consistency method contains three steps: (1) prompt a language model using chain-of-thought (CoT) prompting; (2) replace the "greedy decode" in CoT prompting by sampling from the language model's decoder to generate a diverse set of reasoning paths; and (3) marginalize out the reasoning paths and aggregate by choosing the most consistent answer in the final answer set.

• Self-consistency: https://arxiv.org/abs/2203.11171

Further Reading

- Evaluation of CoTs
- Smaller LLMs trained with Larger LLM teachers
- Synthetic CoT datasets

Verify step-by-step: https://arxiv.org/abs/2305.20050

Tree of thoughts: https://arxiv.org/abs/2305.10601

WizardLM: https://arxiv.org/abs/2304.12244

Self Consistency: https://arxiv.org/abs/2203.11171

Orca: https://www.microsoft.com/en-us/research/blog/orca-2-teaching-small-language-models-how-to-reason/