

Step 1: Activate Python Environment and Set API Key

```
● (base) → fine_tuning source myenv/bin/activate
```

```
● (myenv) (base) → fine_tuning export OPENAI_API_KEY=sk-I6sGTI4EZUpGtwYMrvKT3B1bkFJeye0cefQa0h9SWtkgHNu
```

Step 2: Create JSONL File

```
{ } data.json 1 ●
Users > julia > Desktop > { } data.json > ...
1  { "prompt": "When do I have to start the heater?", "completion": "Every day in the morning at 7AM. You should stop it at 2PM" }
2  { "prompt": "Where is the garage remote control?", "completion": "Next to the yellow door, on the key ring" }
3  { "prompt": "Is it necessary to program the scent diffuser every day?", "completion": "The scent diffuser is already programmed, you just n
4
```

Step 3: Analyze and Prepare Data

```
(myenv) (base) → fine_tuning openai tools fine_tunes.prepare_data -f data.json
```

Analyzing...

- Your file contains 3 prompt-completion pairs. In general, we recommend having at least a few hundred examples. We've found that performance tends to linearly increase for every doubling of the number of examples
- All prompts end with suffix `?`
- Your data does not contain a common ending at the end of your completions. Having a common ending string appended to the end of the completion makes it clearer to the fine-tuned model where the completion should end. See <https://platform.openai.com/docs/guides/fine-tuning/preparing-your-dataset> for more detail and examples.
- The completion should start with a whitespace character (` `). This tends to produce better results due to the tokenization we use. See <https://platform.openai.com/docs/guides/fine-tuning/preparing-your-dataset> for more details

Based on the analysis we will perform the following actions:

- [Recommended] Add a suffix ending `\n` to all completions [Y/n]: Y
- [Recommended] Add a whitespace character to the beginning of the completion [Y/n]: Y

Your data will be written to a new JSONL file. Proceed [Y/n]: Y

Wrote modified file to `data_prepared.jsonl`
Feel free to take a look!

Now use that file when fine-tuning:

```
> openai api fine_tunes.create -t "data_prepared.jsonl"
```

After you've fine-tuned a model, remember that your prompt has to end with the indicator string `?` for the model to start generating completions, rather than continuing with the prompt. Make sure to include `stop=["\n"]` so that the generated texts ends at the expected place.

Once your model starts training, it'll approximately take 2.48 minutes to train a `curie` model, and less for `ada` and `babbage`. Queue will approximately take half an hour per job ahead of you.

Jsonl file is generated:

```
{ } data_prepared.jsonl
{ } data.json
```

Step 4: Fine-Tune the Model

```
$ openai api fine_tunes.create -t "data_prepared.jsonl" -m curie
```

```

Upload progress: 100% | 417/417 [00:00<00:00, 639kit/s]
Uploaded file from data_prepared.jsonl: file-98FxFK3uKP31TYP7B71FOULDa
Created fine-tune: ft-bqghwGxxcg7Z4RKV6cFmEYJq
Streaming events until fine-tuning is complete...

(Ctrl-C will interrupt the stream, but not cancel the fine-tune)
[2023-11-20 22:29:39] Created fine-tune: ft-bqghwGxxcg7Z4RKV6cFmEYJq
[2023-11-20 22:29:41] Fine-tune costs $0.00
[2023-11-20 22:29:42] Fine-tune enqueued. Queue number: 0

```

Step 5: List Fine-Tuned Models

```
$ openai api fine_tunes.list
```

```

{
  "object": "list",
  "data": [
    {
      "object": "fine-tune",
      "id": "ft-bqghwGxxcg7Z4RKV6cFmEYJq",
      "hyperparams": {
        "n_epochs": 4,
        "batch_size": 1,
        "prompt_loss_weight": 0.01,
        "learning_rate_multiplier": 0.1
      },
      "organization_id": "org-5Wp0wasio09MFN8F2b7ki4ap",
      "model": "curie",
      "training_files": [
        {
          "object": "file",
          "id": "file-98FxFK3uKP31TYP7B71FOULDa",
          "purpose": "fine-tune",
          "filename": "data_prepared.jsonl",
          "bytes": 417,
          "created_at": 1700548178,
          "status": "processed",
          "status_details": null
        }
      ],
      "validation_files": [],
      "result_files": [],
      "created_at": 1700548179,
      "updated_at": 1700548182,
      "status": "pending",
      "fine_tuned_model": null
    }
  ]
}

```

Step 6: Resume Fine-Tuning

```
$ openai api fine_tunes.follow -i ft-eIt0cXubewlMeLtlJ4Sh7Lml
```

```

[2023-11-20 22:39:09] Created fine-tune: ft-eIt0cXubewlMeLtlJ4Sh7Lml
[2023-11-20 22:59:50] Fine-tune costs $0.00
[2023-11-20 22:59:50] Fine-tune enqueued. Queue number: 0
[2023-11-20 22:59:51] Fine-tune started
[2023-11-20 23:00:52] Completed epoch 1/4
[2023-11-20 23:00:52] Completed epoch 2/4
[2023-11-20 23:00:53] Completed epoch 3/4
[2023-11-20 23:00:54] Completed epoch 4/4
[2023-11-20 23:01:13] Uploaded model: curie:ft-personal-2023-11-21-07-01-13
[2023-11-20 23:01:14] Uploaded result file: file-mro92uGsLRAX5QckM1L6yxly
[2023-11-20 23:01:14] Fine-tune succeeded

Job complete! Status: succeeded 🎉
Try out your fine-tuned model:

openai api completions.create -m curie:ft-personal-2023-11-21-07-01-13 -p <YOUR_PROMPT>

```

Step7:Use the Fine-Tuned Model

```

$ export FINE_TUNED_MODEL="<FINE_TUNED_MODEL>"
$ openai api completions.create -m $FINE_TUNED_MODEL -p <YOUR_PROMPT>

```

Step 8: Use python

```

1  import openai
2  import os
3  from dotenv import load_dotenv, find_dotenv
4  _ = load_dotenv(find_dotenv()) # read local .env file
5
6  openai.api_key = os.environ['OPENAI_API_KEY']
7
8  FINE_TUNED_MODEL="curie:ft-personal-2023-11-21-07-01-13"
9  YOUR_PROMPT="What is the remote for?"
10
11 response = openai.Completion.create(
12     model=FINE_TUNED_MODEL,
13     prompt=YOUR_PROMPT
14     # additional parameters
15     # temperature,
16     # frequency_penalty,
17     # presence_penalty
18     # ..etc
19 )
20 print(response)

```

Result:

```
$ python3 test.py
{
  "id": "cml-8NFFX0TayawYZZIw48FjRec153EVr",
  "object": "text_completion",
  "created": 1700550855,
  "model": "curie:ft-personal-2023-11-21-07-01-13",
  "choices": [
    {
      "text": "\n\n\u003cp\u003eRCA plugs into the wall",
      "index": 0,
      "logprobs": null,
      "finish_reason": "length"
    }
  ],
  "usage": {
    "prompt_tokens": 6,
    "completion_tokens": 16,
    "total_tokens": 22
  }
}
```

Step 9: Analyze Fine-Tuned Model

```
(sharoncao0920@Sharon) ~/Desktop/Fine-tune
$ openai api fine_tunes.results -i ft-eIt0cXubw1MeLtlJ4Sh7Lm1
step,elapsed_tokens,elapsed_examples,training_loss,training_sequence_accuracy,training_token_accuracy
1,25,1,1.6863485659162203,0.0,0.363636363636365
2,58,2,1.4617992158653215,0.0,0.55
3,91,3,1.7533674666797743,0.0,0.23529411764705882
4,124,4,1.312146593441721,0.0,0.55
5,157,5,1.601872600489296,0.0,0.29411764705882354
6,182,6,1.434608019342025,0.0,0.454545454545453
7,207,7,1.3744844387223323,0.0,0.454545454545453
8,240,8,1.065065179914236,0.0,0.65
9,273,9,1.3830768561922013,0.0,0.35294117647058826
10,306,10,1.3652678412059323,0.0,0.35294117647058826
11,339,11,1.0061288996529765,0.0,0.65
12,364,12,1.2389785048365591,0.0,0.454545454545453
13,397,13,1.0058308023260907,0.0,0.65
```