

## Fine-Tuning and Data Evaluation

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## Outline

Introduction of Pipeline Services

Usage of Pipelines

Hand-on Practice



# Introduction of Pipeline Services

- Web UI
- Operating data and model on Git server

**01** Data Automation

02 LLM Training

03 Model Evaluation



**1** Data Generation

Generate dataset from seed dataset.

02 Data Evaluation

Score the quality of dataset.



## Data Generation

Expand on minimal data

#### Pre Processing

Convert EXCEL, JSON, JSONL to compatible format.

#### **Data Generation**

Generate new data based on seed data with LLM.

#### Post Processing

Convert format, remove some metadata.

#### **Data Distillation**

Remove bad data, such as misspelling, not answering the question, broken grammar etc.

#### Data Convert

Convert to training ready format.



## Data Evaluation

#### **Typo-Free Score**

 Detect errors like misspelled or misused words, mixing different languages, terms not used in Taiwan. Higher when less errors detected.

#### Perplexity (PPL) Score

• Lower when sentences are less fluent, with issues like wrong homophones or word order errors.

#### **Diversity Score & Redundant Score**

- Greater global diversity and lower repetition in the dataset scored higher.
- Calculated with cosine distance.



# Fine Tuning Pipeline

- Parameters optimized for hardwares to avoid OOM or other problems.
- Automatically converting model format to safetensors.
- Model files saved to Git repository.

Training Data

Base Model

Training — Model Convert — Fine Tuned Model



## Model Evaluation

#### **Question Bank**

• Get Response from Model

#### Scored by other Model

- Compare to Ground Truth
- Generate Text Report and Scores
- Format / Context

#### Post Processing

- Overall Score
- Other Details



## Usage of Pipelines



#### **Login with iService account**

https://jenkins.genai.nchc.org.tw/

#### Select pipeline

- 01-data-automation:
  - 01-data-generation-NCHC
  - 02-data-evaluation
- 02-Ilm-training
- 03-model-evaluation

#### Run pipeline

- Click "Build with Parameters"
- Fill parameters
- Click "Build" and wait



### 01

#### **Git Repository:**

- GitLab (Recommended)
- HuggingFace (Each file under 10 MiB)
- GitHub (Each file under 2GiB/5GiB)

## Preparation

02

#### **LLM Access:**

- Portal
- OpenAI (except data-evaluation)
- OpenAI Compatible (except dataevaluation)



## Hand-on Practice



Path: Dashboard > 01-data-automation > <u>01-data-generation-NCHC</u>

Git\_REPO\_URL: GitLab/GitHub/HuggingFace repository url, with "http(s)://"

GIT\_REPO\_TOKEN: Token with R/W permission to the content of repository

- GitLab: Personal access tokens / Project access token
- GitHub: Settings > Developer Settings > Personal access tokens > <u>Fine-grained tokens</u> / Tokens (classic)
- HuggingFace: <u>Access Tokens</u>

**DATA\_FILE:** Path to data, relative to the root directory of the repository

SHEET\_NAME: If using EXCEL, specify which sheet contains the data



Path: Dashboard > 01-data-automation > **01-data-generation-NCHC** 

**GEN\_MODEL:** Model name that you want to use to generate data, depends on your LLM provider.

Usually, can get from \$API\_BASE/models endpoint.

GEN\_API\_URL: URL of your LLM provider, can be any OpenAI compatible.

GEN\_API\_KEY: API key that has permission to use your GEN\_MODEL

**DISTILLATION\_MODEL:** Model name that you want to use for distillation

DISTILLATION\_API\_URL, DISTILLATION\_API\_KEY: As GEN



Path: Dashboard > 01-data-automation > <u>01-data-generation-NCHC</u>

TASK: Choose what kind of data you need

TOPIC: If the options in TASK do not meet your need, assign other topic

Q\_COL: The key or column name of question/user input field in your data

A\_COL: The key or column name of answer/assistant output field in you data

**DEFAULT\_COUNT:** How many pairs you want to generate from a seed pair

**SAMPLE:** How many data you want to sample as seed data, set to 0 for use all

**SYSTEM\_MSG:** Instruction for data generation



Path: Dashboard > 01-data-automation > **01-data-generation-NCHC** 

**DO\_DEDUP:** Do deduplication or not

SIMILARITY\_THRESHOLD: Remove data if the similarity higher than this number

**DO\_DISTILLATION:** Do distillation or not



Path: Dashboard > 01-data-automation > <u>02-data-evaluation</u>

**REDUNDANCY\_THRESHOLD:** The value for calculating redundancy



## LLM Training

Path: Dashboard > <u>02-llm training</u>

BASE\_MODEL: Base model to train

MAX\_EPOCHS: How many round to train

**DEEPSPEED\_ZERO\_STAGE:** Level of optimization, speed vs memory consuming

MAX\_MODEL\_LENGTH: Max content lenght, not longer than base model

MODEL\_CONFIG\_TORCH\_DTYPE: Percision of trained model, depends on GPU,

v100 supports fp16/32

HARDWARE\_TYPE: Model of GPU, recently only v100

GPU\_COUNTS: How many GPU to use in this training session

EMAIL\_NOTIFY: True for email notification on pipeline finishing



## Model Evaluation

Path: Dashboard > <u>03-model-evaluation</u>

**GEN\_MODEL\_SOURCE:** Choose the source of the model you want to evaluate, can be OpenAI, OpenAI compatible or NCHC provided.

GEN\_MODEL, GEN\_BASE\_URL, GEN\_API\_KEY: Info to use model

JUDGE\_MODEL\_SOURCE: Choose the source of the model as the judge

JUDGE\_MODEL, JUDGE\_MODEL\_URL, JUDGE\_MODEL\_KEY: Info to use model

**EVAL\_ITER:** How many round to score

**TASKS:** The tasks to evaluate, depends on the purpose of using model



## Model Evaluation

Path: Dashboard > <u>03-model-evaluation</u>

MAX\_NEW\_TOKENS: Max length for model's answer

BATCH\_SIZE: Max number of async client interaction with LLM

NUM\_ROWS: How many rows to evaluate



## Example Data Format

https://gitlab.td.nchc.org.tw/baronhsu/llm-bootcamp-0618



