Applied LLM Engineer Assignment: Table Generation from Natural Language Input

Objective:

This assignment aims to implement a language model (LLM) that can take natural language input and generate corresponding tabular data. The model will be expected to interpret natural language descriptions or instructions and produce well-structured tables.

Dataset:

https://drive.google.com/file/d/1w3SoPPU8ItB8bdy0xBNmg1AOs2-J8ZYG/view?usp=sharing

You are provided with 10 tabular datasets. All_datasets_metadata.xlsx file contains the general description of the 10 datasets.

- Data source
- Data usage

within each dataset's folder, there is a file called column_info.csv, which contains the following information

- Description for each column
- Data type for each column

Folder "50K Songs Dataset - Generated by AI" misses the column info.csv file.

Instructions:

1. Pretrained LLM Selection:

- You may choose a pretrained LLM you are most familiar with (e.g., GPT, Llama, deepseek, etc.).
- o Fine-tune the LLM to generate tabular data based on natural language input.

2. **Task:**

 Your model should generate tabular data corresponding to the input natural language query. This includes generating column names and data based on the descriptions provided in the datasets.

3. Evaluation of Synthetic Data Quality:

- Propose a method to evaluate the quality of the synthetic tabular data generated by the model. This could include aspects such as:
 - Consistency with the original data distribution
 - Fidelity to the data types
 - Validity and completeness of the generated tables
 - Statistical measures (e.g., similarity metrics, data consistency checks)

4. Optimization:

 Consider strategies to optimize the model's fine-tuning and inference processes. This can include:

- Techniques for efficient fine-tuning of pretrained models
- Reducing inference time for generating tabular data
- Any other method to improve the overall system performance.

5. Reporting:

- o In your final report, you need to include:
 - **Model Fine-Tuning Time:** Report the time it took to fine-tune the model on the provided datasets.
 - Inference Time: Measure and report the time it takes for the model to generate a table based on a given query.
 - **Synthetic Data Quality:** Discuss your chosen evaluation metrics and how the synthetic data compares to the original datasets.

Deliverables:

- Code Implementation: Include all scripts and code used for fine-tuning and generating the synthetic tables.
- **Evaluation Results:** Provide the evaluation results for the generated synthetic data.
- **Final Report:** A comprehensive report that includes your approach, optimization strategies, time measurements, and a discussion of the results.
 - o Brownie points for sharing something with us that we wouldn't know!

Submission Guidelines:

- Submit all code and the final report in a well-organized format.
- Provide clear instructions on how to run your code.

Notes:

The user will only prompt the model, for instance, here is an example prompt:

"You are tasked with generating a synthetic dataset based on the following description. The dataset should include the following columns:

- 1. **Name** (String): A person's name. The name should reflect common names in Singapore, including both English and Chinese names.
- 2. **Age** (Integer): The age of the individual. It should be a random number between 18 and 60.
- 3. **Gender** (String): The gender of the individual. The possible values are 'Male' or 'Female'.
- 4. **Location** (String): The geographical region within Singapore where the individual resides. The possible values are 'Central', 'East', 'West', 'North', 'South'.
- 5. **Income** (Float): The monthly income of the individual. The income should range from \$3000 to \$8000, rounded to two decimal places.
- 6. **Occupation** (String): The occupation of the individual. The possible values are 'Engineer', 'Teacher', 'Doctor', 'Artist', 'Entrepreneur', or 'Nurse'.

So for your example, of course you may not use the same column name and type, but this information should be given as a prompt.

The number of rows may also need to be given within the prompt if your fine-tuning can take this parameter into account. But if you fix it, say 100 rows, it is also ok. And what we expect is to output a csv file or the csv file format data so that we can export it into a csv file. If you can wrap it into a table view to visualize, it can be even better.

And yes, we expect you to fine-tune one model that can synthesize all datasets (in the Google Drive link above).

Regarding GPUs,use Google colab to do your assignment. We do not need you to work on a super big model. A small and quantized LLM is enough. What really matters is your thinking process and the optimization tricks that you considered. If your resource is limited, fine-tune on less datasets is also ok.