FBS-2843: Compare LLMs known performance and parameters.

Insights

- For our use case MIT and Apache 2.0 license is relevant.
- Open Flamingo has 9B parameter size and dataset is large multimodal dataset c4 document, images interleaved.
- **GPT-NeoX and GPT-J 20B** and 6B has parameter size and dataset is Pile An 800GB Dataset of Diverse Text for Language Modeling derive from academic or professional sources.
- OpenLLaMa has 7B parameter size and dataset is RedPajama dataset contains Common crawl, C4, GitHub, Book, ArXiv, Wikipedia, Stack Exchange
- **StableLM** has 3B parameters size and dataset is higher quality data sources and mixtures; specifically, the use of RefinedWeb (is built through stringent filtering and large-scale deduplication of CommonCrawl) and C4 (is the processed version of Google's C4 dataset).
- **Dolly** has 12B parameter size and dataset is capability domains from the InstructGPT paper, including brainstorming, classification, closed QA, generation, information extraction, open QA and summarization. Dataset is licensed for commercial use.
- **Falcon** has 40B parameter size and dataset was collected from public crawls of the web to build the pretraining dataset of Falcon. Using dumps from CommonCrawl, after significant filtering then extended with a few curated sources such as research papers and conversations from social media.

Criteria

- Size of model
 - o Larger models requiring more powerful hardware and incurring higher costs.
 - Smaller models are more efficient to train, deploying them incurring lower costs.
 - Choosing the smallest possible model that meets our use case, we can optimize our costs and resources.
- Performance I: Use case specific
 - o Trained on Technical dataset for better recommendation.
 - o RedPajama, Common crawl, C4, GitHub, Book, ArXiv, Wikipedia, Stack Exchange
- Performance II: Behavior as Chatbot
 - o How to Evaluate the Quality of LLM-based Chatbots | by Matt Ambrogi | Towards Al
 - Chatbot evaluation at a high level
 - What is a good response?
 - **Strategy forms an intuitive opinion** done by asking a lot of questions and getting a feel for whether your bot's responses tend to be good or not.
 - How is qualitative evaluation done?
 - **Strategy thumbs integration:** thumbs up / thumbs down next to a response that allows users to report whether the answer was helpful or not.

Conclusion

- These models are interesting to look into for our use case.
 - o GPT-NeoX 20B (MIT)
 - GPT-J 6B (Apache 2.0)
 - OpenLLaMa 7B (Apache 2.0)
 - Falcon 40B (Apache 2.0)

Below is table showing detailed description of selected model with size, license, dataset used to train them, and GitHub link.

| Model | Size | License | Dataset | Description | GitHub Link |
|---------------|------|---------------|---|--|--|
| Open Flamingo | 9B | MIT | Is trained on a large multimodal dataset (e.g. Multimodal C4) arxiv.org/pdf/2304.06939.pdf | Open source implementation of Deepmind's Flamingo model | GitHub - mlfoundations/open flamingo: An open-source framework for |
| | | | is an augmentation of the popular text-only c4 corpus with images interleaved. The corpus contains 103M documents containing 585M images interleaved with 43B English tokens. | | training large multimodal models. |
| Alpaca 7B | 7B | Apache 2.0 | is fine-tuned from a 7B LLaMA model on 52K instruction-following data generated by the techniques in the Self-Instruct GitHub - tatsu-lab/stanford alpaca: Code and documentation to train Stanford's Alpaca models, and generate the data. | Stanford's Instruction- following LLaMA Model | GitHub - tatsu- lab/stanford al paca: Code and documentation to train Stanford's Alpaca models, and generate the data. |
| | | | contains 52K instruction-following data we used for fine-tuning the Alpaca model. | | Stanford CRFM |
| Falcon | 40B | Apache 2.0 | data was collected from public crawls of the web to build the pretraining dataset of Falcon. Using dumps from CommonCrawl, after significant filtering [2306.01116] The RefinedWeb Dataset for Falcon LLM: Outperforming Curated Corpora with Web Data, and Web Data Only (arxiv.org) | is a foundational LLM with 40 billion parameters trained on one trillion tokens. | Falcon LLM - Home (tii.ae) |
| | | | dataset was then extended with a few curated sources such as research papers and conversations from social media. | | |
| OpenLLaMa | 7B | Apache 2.0 | trained on the RedPajama dataset. togethercomputer/RedPajama-Data- 1T · Datasets at Hugging Face DatasetToken Count Commoncrawl 878 Billion C4 175 Billion GitHub 59 Billion Books 26 Billion | Another Open source reproduction of Meta Al's LLaMA 7B trained on the RedPajama dataset. | GitHub - openIm- research/open Ilama: OpenLLaMA, a permissively licensed open source reproduction of |

| | | | | T | |
|--------------|----------|--------|--|----------------------|------------------------|
| | | | ArXiv 28 billion | | Meta Al's |
| | | | Wikipedia 24 Billion | | <u>LLaMA 7B</u> |
| | | | StackExchange 20 Billion | | trained on the |
| | | | Total 1.2 Trillion | | <u>RedPajama</u> |
| | | | | | <u>dataset</u> |
| ColossalChat | 7B | Apache | 104K bilingual datasets of Chinese and | An open-source | ColossalAI/appl |
| | | 2.0 | English, and you can find the datasets | solution for cloning | ications/Chat |
| | | | in this repo InstructionWild and in this | ChatGPT with a | at main · |
| | | | file. | complete RLHF | hpcaitech/Colo |
| | | | me. | • | |
| | | | Citt by V. F. bas floors are with | pipeline. | <u>ssalAI · GitHub</u> |
| | | | GitHub - XueFuzhao/InstructionWild | | |
| | | | | | |
| | | | Instruction Tuning is a key | | |
| | | | component of ChatGPT. OpenAI used | | |
| | | | their user-based Instruction dataset, | | |
| | | | but unfortunately, this dataset is not | | |
| | | | open-sourced. | | |
| | | | project targets on a larger and more | | |
| | | | diverse instruction dataset. collected | | |
| | | | (110K in v2 dataset, 429 in v1 | | |
| | | | dataset) instructions from ChatGPT | | |
| | | | · · · · · · · · · · · · · · · · · · · | | |
| | | | usage sharing and released both | | |
| | | | English and Chinese versions. | | |
| FastChat-T5 | 3B | Apache | 125K user-shared conversations | Chatbot trained by | <u>GitHub - lm-</u> |
| | | 2.0 | gathered from ShareGPT.com with | fine-tuning Flan-t5- | sys/FastChat: |
| | | | public APIs. To ensure data quality, we | xl on user-shared | <u>An open</u> |
| | | | convert the HTML back to markdown | conversations | platform for |
| | | | and filter out some inappropriate or | collected from | training, |
| | | | low-quality samples. Additionally, we | ShareGPT | serving, and |
| | | | divide lengthy conversations into | | evaluating |
| | | | smaller segments that fit the model's | | large language |
| | | | maximum context length. | | models. |
| | | | maximum context length. | | Release repo |
| | | | FastChat/dass/sammands/data_slag | | - |
| | | | FastChat/docs/commands/data_clea | | for Vicuna and |
| | | | ning.md at main · Im-sys/FastChat · | | Chatbot Arena. |
| | | | <u>GitHub</u> | | |
| | 1 | | | | |
| | <u> </u> | | not release the ShareGPT dataset. | | |
| GPT-J | 6B | Apache | The Pile: An 800GB Dataset of Diverse | Eluether Al's open | <u>GitHub</u> - |
| | | 2.0 | Text for Language Modeling | source version of | kingoflolz/mes |
| | | | | GPT with fewer | h-transformer- |
| | | | [2101.00027] The Pile: An 800GB | params | jax: Model |
| | 1 | | Dataset of Diverse Text for Language | | parallel |
| | | | Modeling (arxiv.org) | | transformers in |
| | | | | | JAX and Haiku |
| | | | derive from academic or professional | | 27.01.0110110110 |
| | | | sources | | |
| GPT-NeoX | 20B | MIT | The Pile: An 800GB Dataset of Diverse | Fluether Al's anan | GitHub - |
| GF 1-INEUX | 208 | IVIII | | Eluether Al's open | |
| | 1 | | Text for Language Modeling | source version of | EleutherAI/gpt- |
| | | | | GPT with fewer | neox: An |
| | | | | params | implementatio |
| | 1 | 1 | İ | İ | n of model |

| | | | [2101.00027] The Pile: An 800GB Dataset of Diverse Text for Language Modeling (arxiv.org) derive from academic or professional sources | | parallel autoregressive transformers on GPUs, based on the DeepSpeed library. |
|----------|------|---------------|--|--|---|
| Flan-UL2 | 20B | Apache 2.0 | datasets are phrased as instructions which enable generalization across diverse tasks. In Flan2, we released a series of T5 models ranging from 200M to 11B parameters that have been instruction tuned with Flan. A New Open Source Flan 20B with UL2 — Yi Tay [2301.13688] The Flan Collection: Designing Data and Methods for Effective Instruction Tuning (arxiv.org) has been primarily trained on academic tasks | Flan has been primarily trained on academic tasks. model that was trained on top of the already open sourced UL2 20B checkpoint. | google- research/ul2 at master google- research/googl e-research GitHub |
| StableLM | 3B | Apache 2.0 | usage of higher quality data sources and mixtures; specifically, the use of RefinedWeb and C4 in place of The Pile v2 Common-Crawl scrape as well as sampling web text at a much higher rate (35% -> 71%). tiiuae/falcon-refinedweb · Datasets at Hugging Face RefinedWeb is built through stringent filtering and large-scale deduplication of Common Crawl; we found models trained on RefinedWeb to achieve performance in-line or better than models trained on curated datasets, while only relying on web data. allenai/c4 · Datasets at Hugging Face is the processed version of Google's C4 dataset. | Stability Al's LLM model series | GitHub - Stability- Al/StableLM: StableLM: Stability Al Language Models |
| YaLM | 100B | Apache 2.0 | 1.7 TB of online texts, books, and countless other sources in both English and Russian. Yandex Publishes YaLM 100B. It's the Largest GPT-Like Neural Network in Open Source by Mikhail Khrushchev Yandex Medium | Pretrained LLM from Yandex for generating and processing text | GitHub - yandex/YaLM- 100B: Pretrained language model with 100B parameters |

| | | | 25% The Pile — open English dataset by Eleuther AI team 75% Texts in Russian collected by our team (percentages of the whole dataset are given) 12% News from various sources from Yandex Search index 10% Books from the dataset used in Russian Distributional Thesarus 3% Misc texts from the Taiga Dataset 1.5% Dialogues from social media preprocessed in a manner similar to how Reddit is proccessed in The Pile 0.5% Russian portion of Wikipedia | | |
|-------|-----|------------|---|---|---|
| Dolly | 12B | Apache 2.0 | trained on the Databricks machine learning platform that is licensed for commercial use. databricks/databricks-dolly-15k Datasets at Hugging Face is trained on ~15k instruction/response fine tuning records databricks-dolly-15k generated by Databricks employees in capability domains from the InstructGPT paper, including brainstorming, classification, closed QA, generation, information extraction, open QA and summarization. | Pythia 12B LLM trained on Databricks ML platform | GitHub - databrickslabs/ dolly: Databricks' Dolly, a large language model trained on the Databricks Machine Learning Platform |