Smart Lightweight Medical Query System (SLiMQ)

Aiding Doctors with AI generated Medical Responses





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Problem Statement

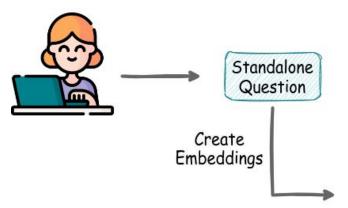
Develop a smart medical response system supporting doctors while running on local/edge devices.

Use Cases:

Resource Optimization in Healthcare: Relieving medical professionals, automating tasks allows focused attention on critical issues.

Lifestyle-Driven Health Concerns: Changing lifestyles in India contribute to a surge in chronic diseases.

Telemedicine Growth: With the rise of telemedicine in India, there is a growing need for intelligent systems that can seamlessly integrate into telehealth platforms

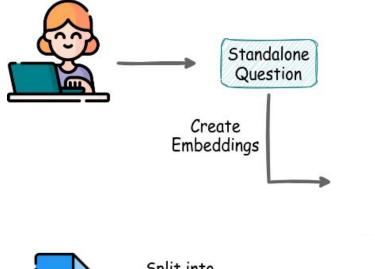


The process of creating/transforming a embedding is called encoding.

User Query:

We start by asking user a query and convert these words/sentences to vector for further computation.

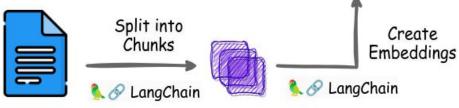
MASHQA Context

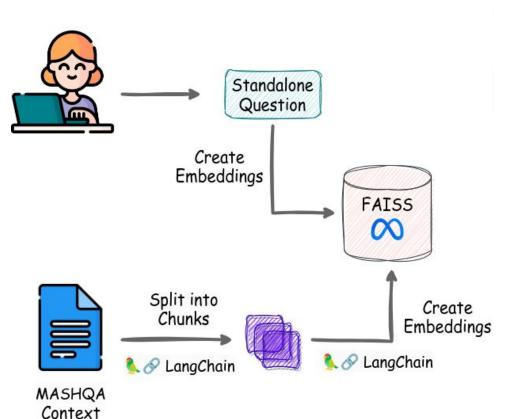


Using a contextual dataset along with query helps to get domain aware answer.

Here, we divide a standalone database into chunks.

Why? Next slide!

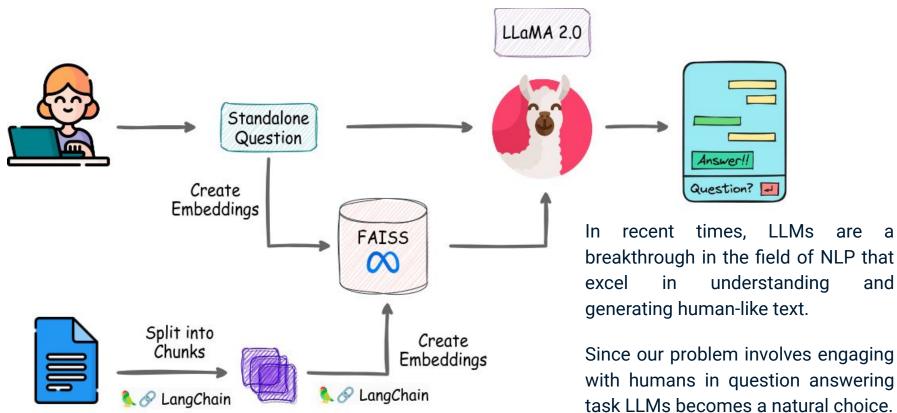




FAISS, a open-source library from Facebook, that allows us to quickly search for similar embeddings of documents and cluster high-dimensional vectors in feature space using various similarity matrices.

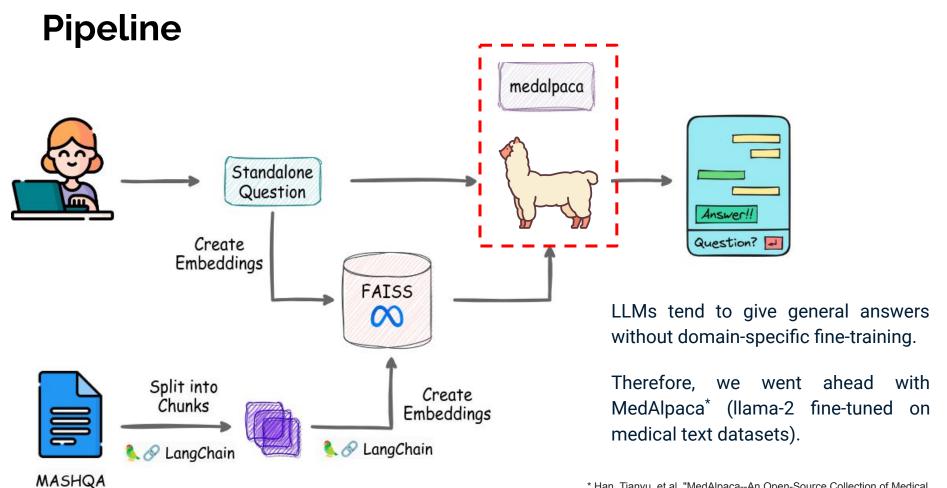
We are now calculating the similarity of our query with the set of contextual chunks to add the most similar chunk as a instruction along with query.

MASHQA Context



Since our problem involves engaging with humans in question answering

and



Context

^{*} Han, Tianyu, et al. "MedAlpaca--An Open-Source Collection of Medical Conversational Al Models and Training Data." 2023

LLMs Used

- LLaMA 2 (meta-llama/Llama-2-7b-chat-hf)
 - 7b parameters
 - with/without vectorstore
- Medalapaca (medalpaca/medalpaca-7b)
 - LLaMA 2 backbone
 - o fine-tuned on medical data
 - with/without vectorstore





NOTE:

- We weren't able to finetune either model on MASHQA dataset due to memory limitations
- Only HuggingFace models were used

Model Compression

Knowledge Distillation:

Initially we aimed to fine-tune a baby LLM (small size) from existing larger size medical text LLMs with the help of knowledge distillation. But, we weren't able to do so due to memory limitation.

Pruning:

Pruning reduces model complexity and saves memory by removing unnecessary parameters, improving efficiency and speeding up inference in machine learning models. Unlike traditional methods, a recent approach, Wanda^{*}, requires no retraining and offering computational efficiency in using the pruned LLM.

Quantization:

Quantization reduces the memory footprint (e.g., 4,5,6 8-bit integers) of the model. In large models, it is essential for efficient deployment, reducing memory and storage usage, improving inference speed, and ensuring compatibility with various platforms and devices.

^{*} Sun, Mingjie, et al. "A Simple and Effective Pruning Approach for Large Language Models." arXiv preprint arXiv:2306.11695 (Oct 2023).

Quantization

- GGML employed for model quantization.
 - C/C++ library for efficient Llama model inference.
 - Capable of loading GGML models for CPU execution.
- Strategies
 - q4_k_m: Half attention.wv & feed_forward.w2 use
 Q6_K, rest use Q4_K.
 - q5_k_m: Half attention.wv & feed_forward.w2 use
 Q6_K, rest use Q5_K.
- Memory Footprint
 - o **q4_k_m**: 13.5 GB -> 4 GB
 - o **q5_k_m**: 13.5 GB -> 4.5 GB

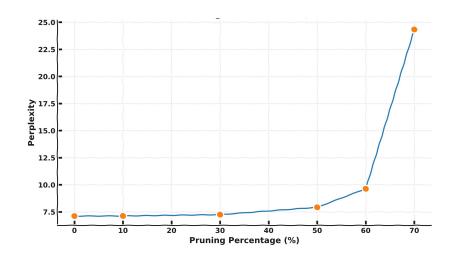


Fig 1: Pruning effect on SLiMQ

Quantization

Llama 2 7b chat

User: What should I do if I want to stop dialysis?

System: Stop hospice care and start back on treatments. You can also keep up these habits to stay well:

- 1. Eat right. Stick to a healthy, well-balanced diet []
- 2. Exercise regularly. Doctors often recommend exercise for people with kidney disease []
- 3. Don't smoke. Smoking raises blood pressure and can damage blood vessels, []
- 4. Limit alcohol to 2 drinks a day if you are an adult age 18
- 5. Don't take too many nonsteroidal anti-inflammatory drugs (NSAIDs), such as ibuprofen or naproxen []
- 6. Get enough sleep. Most adults need 7 to 8 hours of sleep each night.

Quantised Llama 2 7b chat + vectorstore

User: What should I do if I want to stop dialysis?

System: Here are some steps you can take if you want to stop dialysis:

- 1. Discuss your decision with your nephrologist or kidney doctor: It is important to discuss your decision []
- Review your medical history: Your nephrologist []
- 2. Check your blood chemistry and other test results: Your nephrologist or kidney doctor may perform additional tests
- 3. Consider hospice care: If you have a terminal illness and are not likely to recover, your nephrologist []
- 4. Make arrangements for end-of-life care:
- 5. Seek support from family and friends:
- 6. Consider alternative options: Depending on your specific situation, there may be alternative options available to help manage your kidney failure.

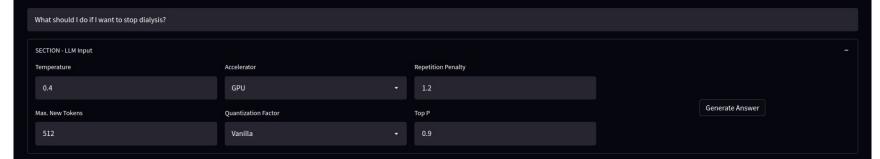
It is important to note that stopping dialysis is a complex decision that should be made with the guidance of your healthcare provider and support from loved ones. It is also important to consider your personal preferences and values when making this decision.

Streamlit WebApp

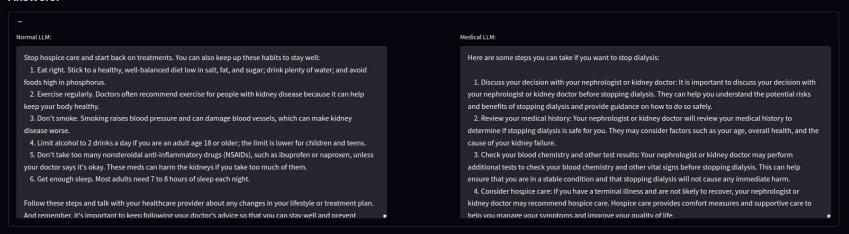


Smart Lightweight Medical Query System

What is your question?



Answers!



Thank You