Note on "RetLLM-E: Retrieval-Prompt Strategy for Question-Answering on Student Discussion Forums"

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1 Which problem is addressed by the paper?

This paper focuses on using Large Language Models(LLMs) to support teaching assistants in answering questions on specific aspects, like course-assignments QA. Not only give thorough answers, but guide students to the right direction, by providing prompts to help them think critically and solve the problem themselves.

2 Why is it important?

- LLMs are weak in answering specific questions about a course's content or assignments.
- In educational settings, the relevance and factuality are of utmost importance. In contrast, hallucination often occurs in LLMs.

3 How is it solved?

- Each student question is passed to both Q&A retrieval and document retrieval modules.
- The Q&A retrieval module uses **multi-qa-mpnet-basedot-v1** as a backbone. This paper use the nearest neighbor approach to identify the top three Q&A pairs closest to the original student question from the bank of processed Q&A pairs.
- This paper uses a document retrieval pipeline with an **InstructorXL** backbone.

- leverage prompt engineering to incorporate both the Q&A and document context into a prompt template designed to enhance the pedagogical value of the generated response.
- prompt the LLaMA-2-13B-chat model with weighted sampling from the top five token.

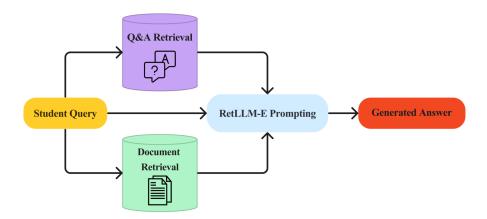


Figure 1: Full Pipeline. This figure shows the 3 main parts RetLLM-E blue. The i question $yellow\ ii$ the document retrieval module green, and iii the Q&A retrieval module purple are incorporated into a prompt-engineered format for the LLM to generate a response red.

RetLLM-E Prompt Structure

Expert Prompting:

 "...member of teaching staff experienced in answering student queries..."

Task Preconditioning:

- "...data science and statistics..."
- "...answer N/A if the question is difficult to answer with the provided information..."

Tone Preconditioning:

• "...clear, helpful, and positive tone..."



Q&A Context



Document Context

Student Query

Figure 2: RetLLM-E Prompt. The prompt structure of RetLLM-E is outlined. In addition to the key elements of Q&A context, document context, and the student question, we include prompt-engineering methods to provide tailored responses to students' questions and not reinforce misconceptions if the LLM is unsure of the answer.

4 DataAnalysis, Applications, Conclusion and Future Work

Evaluation: The authors evaluate their system in the context of the Ed-STEM discussion forum for UcB's course DATA 100. The cleaned and processed dataset contains 6016 QA pairs. They formatted the raw anonymized content to optimize the data for retrieval tasks. Each structured data point, or Q&A pair, comprises the student question, the corresponding staff response, and key post details from EdSTEM (the post title and the associated context from prior conversations under the same thread).

5 Why is it published in AAAI?