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Fachbereich Informatik
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Master Project Computer Science

LitQEval: Measuring Effectiveness of Search Queries Computer Science

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Abstract

This work is based on a larger initiative known as the Search Query Writer (SQW), an internal tool developed at Fraunhofer INT to aid scientific researchers in creating comprehensive literature search queries. These queries are intended to provide researchers with a strong starting point in a topic area they may have limited knowledge about.

The current state of the SQW tool presents a key challenge: the absence of a mechanism to evaluate the quality of the generated queries. As a result, the evaluation has so far been conducted subjectively. This project aims to address this issue by introducing a dataset that contains publications deemed relevant to specific topics. Additionally, it introduces several metrics to account for different aspects of query evaluation, given the complexity of the task.

(Explain performed experiments after completing them)

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1. Introduction

The Fraunhofer Institute for Technological Trend Analysis (INT)¹ is a research institute that frequently undertakes new tasks and research questions across various fields. Often, these inquiries require systematic and robust scientific responses, even when the initial knowledge in the area may be limited at the time. Given the recurring nature of this challenge, a tool that can support researchers by providing a head start and entry point into unfamiliar fields is essential.

To address this, several internal tools have been developed to analyze large volumes of scientific data from sources like Dimensions.ai² and Web of Science³. The rise of large language models (LLMs) has further enhanced the appeal and accessibility of automation across numerous domains, including scientific research, spanning from idea generation and experimental iteration to paper composition[2].

In the realm of search queries, the main focus has been on text-to-SQL[1], where an LLM is prompted via natural language to generate a precise and valid SQL query. However, to our knowledge, there has been limited and non-diverse effort dedicated to the development of text-to-literature search queries. Thus this work introduces a pipeline and curates a dataset designed to address this gap, with a particular focus on enhancing the Fraunhofer Search Query Writer tool.

1.1. Motivation

The SQW tool is currently under development by the company and has generated significant interest among researchers. However, a primary challenge we face after testing earlier versions is evaluating the quality of the generated queries. Initially, we considered gathering human feedback from users by requesting them to rate the generated query on a scale of 0 to 5. While this approach could be useful for fine-tuning the underlying model, the quantity of feedback has so far been limited and remains subjective. This is especially problematic because the tool's purpose is to generate queries for researchers who are new to a given topic. Consequently, if the query quality is poor, the researcher may not immediately recognize this.

Identifying suitable evaluation metrics and datasets to assess the quality of the generated queries is a complex task, which forms the basis of this master's project. The project's objective is to find a robust solution for assessing the quality of literature search queries, enabling the further development of the SQW tool to

¹https://www.int.fraunhofer.de/

²https://www.dimensions.ai/

³https://clarivate.com/

provide more accurate results and improve productivity through the integration of large language models.

1.2. Research Questions

There are three main research questions that we aim to address while curating the dataset and formulating the metrics to evaluate the generated queries. These questions are based on the following hypothesis: Given that we know which publications are the most important for a given field, which we will refer to as **Core Publications** (CP).

- **RQ1:** How many of the core publications can the generated search query recall?
- **RQ2**: How many of the non-core publications are relevant?
- **RQ3**: Which metric can we use to penalize the model for exploiting the ability to generate large queries to achieve high recall?

1.3. Structure of this Work

The remainder of this work is structured as follows:

After this introduction, we will first focus on the foundations in Chapter 2, where we will briefly explain the SQW tool, primarily focusing on the format of the input and output. We will also cover the necessary basics and information about the main data source, Dimensions.ai, which will be used to curate the dataset ??, as well as common metrics ?? used for evaluation in the community, before discussing related works in Section 2.2.

Next, in Chapter 3, we will detail our approach and its components, which involve curating a dataset that contains core publications and establishing a pipeline to streamline the evaluation process, thereby accelerating the development of the SQW tool.

We will evaluate our approach in Chapter 4, beginning with a description of our experimental setup, where we acquire the generated query via the SQW tool and explain the reasoning behind the selection of topics for which the queries are generated.

Finally, we will conclude this work with a summary of our main contributions and an outlook in Chapter 5.

2. Foundations

In this section, we will begin by briefly introducing the SQW tool to provide a foundational understanding of how its settings may influence the overall results. This introduction will also establish the groundwork for designing an evaluation process that ensures a fair and accurate assessment.

Next, we will review prior works that tackle the challenge of using large language models (LLMs) to generate literature search queries, examining their potential in this domain.

Following this, we will describe the dataset curation process, including relevant statistics and exploratory data analysis. This analysis will help us evaluate the dataset's quality and determine the topics suitable for evaluation.

Then, we will introduce new metrics designed to assess the quality of generated search queries. These metrics are intended not only to identify true positives from core publications but also to account for other potentially relevant publications. Once the evaluation pipeline is established, we will conduct a comparative analysis between a baseline and the queries generated by the SQW tool.

Finally, we will provide an outlook on the next steps and potential optimization options for the SQW tool. Additionally, we will discuss other tools that could be developed to build upon these advancements.

2.1. Search Query Writer

The Search Query Writer is a tool based on a large language model (LLM), specifically using GPT-40, to systematically generate literature search queries. The only required input for this tool, which is the main focus of this work, is the **Topic**. Users are required to provide a topic for generating a search query, irrespective of the scientific field—for example, *Synthetic Biology*.

Several optional inputs are available to enhance the quality of the generated query, including:

- **Negative Keywords:** Terms that should be excluded to avoid unwanted results.
- **Description:** A description that serves as an alignment mechanism to clarify the task's intent.
- Modes: Three selectable modes (Strict, Moderate, Creative) that control the temperature of the LLM to manage the level of randomness in responses.



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Figure 2.1.: Nice long caption

- **Depth:** A parameter that specifies how comprehensively the topic should be analyzed.
- Supporting Documents: Users can upload a PDF, ideally a survey or overview document on the topic, which helps the tool acquire knowledge about the scientific field and better align with the research intent.

These additional inputs are intended to refine and tailor the search query to more closely match the user's research goals, but will not be extensively tested in this work.

To generate a literature search query, we designed the SQW to take a human-like approach, divided into two main steps: **Knowledge Enrichment** and **Iterative Scientific Fine-Tuning**.

The objective of the Knowledge Enrichment step is to provide the LLM with contextual information about the research topic. This is achieved by first retrieving information from Wikipedia based on the given topic. Specifically, the first 4,000 characters from the top-k pages are collected and summarized before being passed into the LLM's memory. ArXiv is queried in a similar manner to gather relevant research content. Additionally, we perform an online search using DuckDuckGo¹, aggregating results to offer a broader understanding of the topic.

Notably, each of the steps is conducted within a separate memory session, with results stored independently for future use. This setup allows the model to explore the topic using various sources, helping to mitigate any potential recency bias and ensure a well-rounded context.

The output of this first stage will be a list of keywords that are usually presented in a transfer-list as shown in Figure 2.2, that contains two lists; specific and general keywords, along side some additional information such as the number of publications found per keyword. The goal is to let the user decide weather a keyword is too broad in which he is supposed to move it to the general list, and if it targets the specified topic quite well then it should stay in the specific list, and at the end they user should also provide an overarching topic for which the scope of the general keywords is limited to be more focused to words the research intent. The output of this step will be the queries that will be used for the evaluation at the end.

The iterative scientific fine-tuning on the other hand approaches more scientific sources, namely dimensions.ai, which is a literature database that offers quick

¹https://duckduckgo.com/



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Figure 2.2.: Nice long caption

access to publications across a wide range of journals. The query generated in the earlier stage is then used to prompt dimensions three times, once to retrieve the most cited 1k literature, a second time to retrieve the newest 1k literature, and one last 1k to retrieve the most relevant documents based on their **DOUBLE CHECK THIS INFO** internal rating metric. This leaves us with a total of 3k publications in which we extract the title and abstract for, and use an Openai's embedding model, and apply a simple RAG pipeline to retrieve the most relevant keywords based on the extracted passages.

2.2. Related Work

3. Own Approach

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3.1. Idea / Overview

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3.2. Component 1

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4. Evaluation

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4.1. Experimental Setup

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4.2. Results

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4.3. Discussion

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5. Conclusion

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5.1. Summary and Contributions

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5.2. Outlook

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A. Appendix

A.1. Further Details on Something

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