

Conversational Information Seeking: Theory and Application

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ABSTRACT

Conversational information seeking (CIS) involves interaction sequences between one or more users and an information system. Interactions in CIS are primarily based on natural language dialogue, while they may include other types of interactions, such as click, touch, and body gestures. CIS recently attracted significant attention and advancements continue to be made. This tutorial follows the content of the recent Conversational Information Seeking book [33] authored by several of the tutorial presenters. The tutorial aims to be an introduction to CIS for newcomers to CIS in addition to the recent advanced topics and state-of-the-art approaches for students and researchers with moderate knowledge of the topic. A significant part of the tutorial is dedicated to hands-on experiences based on toolkits developed by the presenters for conversational passage retrieval and multi-modal task-oriented dialogues. The outcomes of this tutorial include theoretical and practical knowledge, including a forum to meet researchers interested in CIS.

CCS CONCEPTS

• **Information systems** → **Information retrieval**; • **Computing methodologies** → **Discourse, dialogue and pragmatics**; • **Human-centered computing** → **Natural language interfaces**.

KEYWORDS

Conversational search; conversational question answering; conversational recommendation; dialogue systems; chatbots; interactive information retrieval

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1 MOTIVATION

While CIS has roots in early information retrieval (IR) research, recent advances in automatic voice recognition and conversational agents created increasing interest in this area in IR as well as natural language processing and related fields. CIS was recognized as an emerging research area in the Third Strategic Workshop on Information Retrieval in Lorne (SWIRL 2018) [9].¹ Since then, it has grown into a mainstream research sub-field in major IR conferences and continues to evolve rapidly. The areas in CIS now include but are not limited to conversational search conceptualization (e.g., [5, 12, 19]), effective conversational query re-writing (e.g., [28]), generating and selecting clarifying questions (e.g., [30, 32]), conversational preference elicitation (e.g., [18, 35]), and understanding user interactions with spoken conversational systems (e.g., [25, 26]). The growing body of work in this area has been supplemented by an increasing number of recent seminars (e.g., [3]), workshops (e.g., [4, 6, 8, 23]), tutorials (e.g., [1, 13, 15, 16]), shared-tasks (e.g., [10, 20]), and datasets (e.g., [2, 7, 18, 21, 24, 27, 31]).

The purpose of this tutorial is to (1) introduce the topic for newcomers in the field, (2) present a big picture of the recent advances and their connections, (3) highlight the current open problems and directions for future explorations, and (4) suggest practical hands-on applications for CIS. The hands-on part provides experience using publicly available tools and resources. This includes Macaw from CIIR/Microsoft and tools from the GRILL Lab such as the interactive TREC CAsT toolkit (iCAsT), the OpenGRILL research platform used in the Amazon Alexa Taskbot challenge, and the Task Multimodal Agent Dialogue (Task MAD) [22] Wizard-of-Oz toolkit for data collection. Describing, but more importantly, using these systems provides theoretical and practical experience with new and emerging models and systems.

¹<https://sites.google.com/view/swirl3/>

2 OBJECTIVES

The tutorial aims to provide a broad overview of CIS, its basic concepts, and how these concepts interact. Our goal is to provide hands-on starting points for participants to experiment with CIS. The combined knowledge of the presenters and their enthusiasm for CIS will be a perfect starting point for newcomers, including updated techniques for intermediaries. Lastly, this tutorial acts as a forum for researchers interested in CIS.

3 RELEVANCE TO SIGIR

CIS is a core research program within IR. Papers related to conversational search, question answering, and recommender systems have been published in recent SIGIR conferences. In addition, the Conversational Assistance Track (CAST) has been organized by TREC since 2019. All of these demonstrate that there is significant interest in this topic from the SIGIR community.

4 RELATED TUTORIALS

A number of tutorials on the topic have been presented in recent years. They include:

- Recent Advances in Conversational Information Retrieval at SIGIR 2020 by Gao et al. [16]
- Interactive Information Retrieval: Models, Algorithms, and Evaluation at SIGIR 2021 by Zhai [34]
- Conversational Recommendation Systems at WSDM 2021 by Fu et al. [14]
- Conversational Recommendation: Formulation, Methods, and Evaluation at RecSys 2021 by Lei et al. [17]
- Conversational Information Seeking: Theory and Evaluation at CHIIR 2022 by Aliannejadi and Trippas [1]

Unlike the previous tutorials, the tutorial consists of a hands-on component that results in higher engagement and interactivity. In addition, the topics presented in the tutorial are well aligned with the CIS manuscript [33] which gives the audience extra reading material if they are interested in any part of the tutorial. Moreover, the progress in CIS has been rapidly evolving in the last few years, and the tutorial covers new developments in the field. Therefore, we believe that the tutorial has value even for those who attended the previous tutorials.

5 FORMAT AND DETAILED OUTLINE

Even though multiple tutorials appeared in previous IR-related venues, the tutorial is the first to include significant hands-on content with open-source tools on the topic. The tutorial targets the newcomers to the field in addition to researchers and students who have intermediate familiarity with CIS. Table 1 provides a tentative schedule showing the eight major parts.

Part 1: Introduction, Applications, and Historical Context. We start with introductory material to introduce the sub-field of CIS to the students and researchers who are new to the field. Therefore, we spend the first 45 minutes of the tutorial defining CIS, introducing its applications, and connecting with early seminal work related to CIS (e.g., I³R or THOMAS). This part of the tutorial is aligned with the first two chapters of the CIS manuscript [33] in addition to its Appendix A.

Part 2-3: Conversational Interfaces and Result Presentation, and Evaluating CIS Systems.

We continue by looking at CIS from the user perspective. We introduce different interfaces used in conversational systems (e.g., speech-only and multi-modal interfaces) and their unique properties. We also discuss result presentation using each of these interfaces and how users consume information. We further introduce approaches for evaluating CIS systems and explore how they are connected to user satisfaction. This part of the tutorial (a total of 75 minutes) is aligned with Chapters 3 and 7 in the CIS manuscript [33].

Part 4-6: Understanding Conversational Interactions, Conversational Response Ranking and Generation, and Mixed-Initiative Interactions.

We move towards methods for developing CIS systems and the core models in language understanding, ranking algorithms, ranking, and elements of initiative. We start with conversation understanding by introducing concepts related to topic shifting, coreference and ellipsis resolution. We then discuss various methods for ranking responses in conversational search, conversational question answering, and conversational recommendation systems. We also briefly discuss response generation, focusing on conversational question answering tasks. We then introduce types of mixed-initiative interactions, such as clarification and preference elicitation. We spend approximately 90 minutes on this part which is aligned with Chapters 4-6 from the CIS manuscript [33].

Part 7: Hands-on with CIS Platforms. The next part of the tutorial is hands-on. We provide platforms for real-time experimentation during the tutorial, so the audience can become familiar with the development of CIS systems. In more detail, our hands-on part would be based on the following tools:

OpenGRILL this provides hands-on experience using a version of the GRILLBot system developed for the Alexa Taskbot Challenge.² OpenGRILL supports hybrid CIS and task conversations incorporating conversational preference elicitation, conversational task search, and conversational question answering. It demonstrates how a CIS research prototype can be integrated with multiple live assistant frameworks, including Google’s DialogFlow to support real-world interactive experiments. Participants would gain hands-on experience with the latest cloud tools including, Docker, Kubernetes, gRPC, and a distributed architecture designed for diverse and scalable CIS use cases and real-world experimentation.

Interactive CAST (iCAST) Tools provides an interactive and hands-on experience with newly developed interactive CAST tools. This uses Colab and Jupyter Notebook to interact with cloud endpoints to support research on conversational search developed for TREC CAST 2021 [11]. This lets participants build and use a prototype CAST system in 30 minutes.

Task Multimodal Agent Dialogue (TaskMAD) [22] is an open-source platform for performing rich multimodal Wizard-of-Oz CIS experiments. It has been used in the Alexa Prize Challenge and at multiple universities for research and teaching. It supports both conversational search as well as hybrid task-oriented use cases. This would be a short introduction of approximately 15 minutes.

²<https://www.amazon.science/alex-prize/taskbot-challenge>

Table 1: Tentative schedule of the tutorial.

#	Time	Topic	Presenter	Associated Material and Chapters
1	45 min	Introduction, Applications, and Historical Context	Zamani	CIS manuscript, Ch. 1–2 & Appendix A
2	30 min	Conversational Interfaces and Result Presentation	Trippas	CIS manuscript, Ch. 3
3	45 min	Evaluating CIS Systems	Radlinski	CIS manuscript, Ch. 7
4	30 min	Understanding Conversational Interactions	Dalton	CIS manuscript, Ch. 4
5	30 min	Conversational Response Ranking and Generation	Dalton	CIS manuscript, Ch. 5
6	30 min	Mixed-Initiative Interactions	Zamani	CIS manuscript, Ch. 6
7	135 min	Hands-on with iCAST and OpenGRILL	Fischer, Owoicho & Rossetto	OpenGRILL, TaskMAD, and iCAST
8	15 min	Conclusion and Future Direction	Trippas	CIS manuscript, Ch. 8
All	6 hours			

Macaw [29] is an open-source platform for supporting conversational IR research. This Python-based platform extends multiple existing open-source search engines and question answering models. It provides user-friendly uni- and multi-modal interfaces. It is discussed in conjunction with the other tools.

Part 8: Conclusion and Future Direction. We conclude the tutorial by introducing open research problems and future directions in the area.

6 SUPPLEMENTAL MATERIAL

The tutorial website provides supplementary support materials including slides. This also includes specialized (simplified) software tools where appropriate.

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