Methods for Evaluating Interactive Information Retrieval Systems with Users

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Foundations and Trends[®] in Information Retrieval

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Abstract

This paper provides overview and instruction regarding the evaluation of interactive information retrieval systems with users. The primary goal of this article is to catalog and compile material related to this topic into a single source. This article (1) provides historical background on the development of user-centered approaches to the evaluation of interactive information retrieval systems; (2) describes the major components of interactive information retrieval system evaluation; (3) describes different experimental designs and sampling strategies; (4) presents core instruments and data collection techniques and measures; (5) explains basic data analysis techniques; and (4) reviews and discusses previous studies. This article also discusses validity and reliability issues with respect to both measures and methods, presents background information on research ethics and discusses some ethical issues which are specific to studies of interactive information retrieval (IIR). Finally, this article concludes with a discussion of outstanding challenges and future research directions.

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Information retrieval (IR) has experienced huge growth in the past decade as increasing numbers and types of information systems are being developed for end-users. The incorporation of users into IR system evaluation and the study of users' information search behaviors and interactions have been identified as important concerns for IR researchers [46]. While the study of IR systems has a prescribed and dominant evaluation method that can be traced back to the Cranfield studies [54], studies of users and their interactions with information systems do not have well-established methods. For those interested in evaluating interactive information retrieval systems with users, it can be difficult to determine how to proceed from a scan of the literature since guidelines for designing and conducting such studies are for the most part missing.

In interactive information retrieval (IIR), users are typically studied along with their interactions with systems and information. While classic IR studies abstract humans out of the evaluation model, IIR focuses on users' behaviors and experiences — including physical, cognitive and affective — and the interactions that occur between users and systems, and users and information. In simple terms, classic IR evaluation asks

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the question, does this system retrieve relevant documents? IIR evaluation asks the question, can people use this system to retrieve relevant documents? IIR studies include both system evaluations as well as more focused studies of users' information search behaviors and their interactions with systems and information. IIR is informed by many fields including traditional IR, information and library science, psychology, and human-computer interaction (HCI). IIR has often been presented more generally as a combination of IR and HCI, or as a sub-area of HCI, but Ruthven [225] argues convincingly that IIR is a distinct research area. Recently, there has been interest in HCIR, or human computer information retrieval, but this looks similar to IIR and papers about this area have not established its uniqueness (e.g., [191]).

The proposition that IR systems are fundamentally interactive and should be evaluated from the perspective of users is not new. A review of IR literature reveals that many leaders in the field were writing about and studying interactive IR systems during the early years of IR research. For instance, Salton wrote a paper entitled "*Evaluation problems in interactive information retrieval*" which was published in 1970. In this paper, Salton [229] identified user effort measures as important components of IR evaluation, including the attitudes and perceptions of users. Cleverdon et al. [55] identified presentation issues and user effort as important evaluation measures for IR systems, along with recall and precision. Tague and Schultz [259] discuss the notion of user friendliness.

Some of the first types of IR interactions were associated with relevance feedback. Looking closely at this seemingly simple type of interaction, we see the difficulties inherent in IIR studies. Assuming that users are provided with information needs, each user is likely to enter a different query, which will lead to different search results and different opportunities for relevance feedback. Each user, in turn, will provide different amounts of feedback, which will create new lists of search results. Furthermore, causes and consequences of these interactions cannot be observed easily since much of this exists in the user's head. The actions that are available for observation — querying, saving a document, providing relevance feedback — are surrogates of cognitive activities. From such observable behaviors we must *infer* cognitive

1.1 Purpose and Scope 3

activity; for instance, users who save a document may do so because it changes or adds to their understanding of their information needs.

User–system interactions are influenced by a number of other factors that are neither easily observable nor measurable. Each individual user has a different cognitive composition and behavioral disposition. Users vary according to all sorts of factors including how much they know about particular topics, how motivated they are to search, how much they know about searching, how much they know about the particular work or search task they need to complete, and even their expectations and perceptions of the IIR study [139, 194]. Individual variations in these factors mean that it is difficult to create an experimental situation that all people will experience the same, which in turn, makes it difficult to establish causal relationships. Moreover, measuring these factors is not always practical since there are likely a large number of factors and no established measurement practices.

The inclusion of users into any study necessarily makes IIR, in part, a behavioral science. As a result, appropriate methods for studying interactive IR systems must unite research traditions in two sciences which can be challenging. It is also the case that different systems, interfaces and use scenarios call for different methods and metrics, and studies of behavior and interaction suggest research designs that go beyond evaluation. For these reasons, there is no strong evaluation or experimental framework for IIR evaluations as there is for IR studies. IIR researchers are able to make many choices about how to design and conduct their evaluations, but there is little guidance about how to do this.

1.1 Purpose and Scope

There is a small body of research on evaluation models, methods, and metrics for IIR, but such studies are the exception rather than the rule (e.g., [34, 149]). In contrast to other disciplines where studies of methods and experimental design comprise an important portion of the literature, there are few, if any, research programs in IIR that investigate these issues and there is little formal guidance about how to conduct such studies, despite a long-standing call for such work

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[231]. Tague's [260, 262] work and select chapters of the edited volume by Spärck-Jones [246] provide good starting points, but these writings are 15–20-years-old. While it might be argued that Spärck-Jones' book still describes the basic methodology behind traditional IR evaluations, Tague's work, which focuses on user-centered methods, needs updating given changes in search environments, tasks, users, and measures. It is also the case that Tague's work does not discuss data analysis. One might consult a statistics textbook for this type of information, but it can sometimes be difficult to develop a solid understanding of these topics unless they are discussed within the context of one's own area of study.

The purpose of this paper is to provide a foundation on which those new to IIR can make more informed choices about how to design and conduct IIR evaluations with human subjects.¹ The primary goal is to catalog and compile material related to the IIR evaluation method into a single source. This paper proposes some guidelines for conducting one basic type of IIR study — laboratory evaluations of experimental IIR systems. This is a particular kind of IIR study, but not the only kind. This paper is also focused more on quantitative methods, rather than qualitative. This is not a statement of value or importance, but a choice necessary to maintain a reasonable scope for this paper.

This article does not prescribe a step-by-step recipe for conducting IIR evaluations. The design of IIR studies is not a linear process and it would be imprudent to present the design process in this way. Typically, method design occurs iteratively, over time. Design decisions are interdependent; each choice impacts other choices. Understanding the possibilities and limitations of different design choices help one make better decisions, but there is no single method that is appropriate for all study situations. Part of the intellectual aspects of IIR is the method design itself. Prescriptive methods imply research can only be done in

¹ The terms *user* and *subject* are often used interchangeably in published IIR studies. A distinction between these terms will be made in Section 7. Since this paper focuses primarily on laboratory evaluations, the term *subject* will be used when discussing issues related to laboratory evaluations and *user* will be used when discussing general issues related to all IIR studies. *Subject* is used to indicate a person who has been sampled from the *user* population to be included in a study.

1.2 Sources and Recommended Readings 5

one way and often prevent researchers from discovering better ways of doing things.

The focus of this paper is on text retrieval systems. The basic methodological issues presented in this paper are relevant to other types of IIR systems, but each type of IIR system will likely introduce its own special considerations and issues. Additional attention is given to the study of different types of IIR systems in the final section of this paper. Digital libraries, a specific setting where IIR occurs, are also not discussed explicitly, but again, much of the material in this paper will be relevant to those working in this area [29].

Finally, this paper surveys some of the work that has been conducted in IIR. The survey is not intended to be comprehensive. Many of the studies that are cited are used to illustrate particular evaluation issues, rather than to reflect the state-of-the-art in IIR. For a current survey of research in IIR, see Ruthven [225]. For a more historic perspective, see Belkin and Vickery [23].

1.2 Sources and Recommended Readings

A number of papers about evaluation have been consulted in the creation of this paper and have otherwise greatly influenced the content of this paper. As mentioned earlier, the works of Tague [260, 262, 263, 264] and Tague and Schultz [259] are seminal pieces. The edited volume by Spärck-Jones [246] also formed a foundation for this paper.

Other research devoted to the study and development of individual components or models for IIR evaluation have also influenced this paper. Borlund [32, 34] has contributed much to IIR evaluation with her studies of simulated information needs and evaluation measures. Haas and Kraft [115] reviewed traditional experimental designs and related these to information science research. Ingwersen and Järvelin [139] present a general discussion of methods used in information seeking and retrieval research. Finally, the TREC Interactive Track [80] and all of the participants in this Track over the years have made significant contributions to the development of an IIR evaluation framework.

Review articles have been written about many topics discussed in this paper. These articles include Sugar's [255] review of user-centered

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perspectives in IR and Turtle et al.'s [277] review of interactive IR research as well as Ruthven's [225] more recent version. The Annual Review of Information Science and Technology (ARIST) has also published many chapters on evaluation over its 40-year history including King's [173] article on the design and evaluation of information systems,² Kantor's [161] review of feedback and its evaluation in IR, Rorvig's [223] review of psychometric measurement in IR, Harter and Hert's [123] review of IR system evaluation, and Wang's [290] review of methodologies and methods for user behavior research.

Several special issues of journals about evaluation of IR and IIR systems are also worth mentioning. The most current is Borlund and Ruthven's [37] special issue of IP&M about evaluating IIR systems. Other special issues include Dunlop et al.'s [82] special issue of *Interacting with Computers* and Harman's [120] special issue of IP&M, which included Robertson and Hancock-Beaulieu's [221] discussion of changes in IR evaluation as a result of new understandings of relevance, interaction and information behavior. These articles, along with Savage-Knepshield and Belkin's [240] analysis of how IR interaction has changed over time, Saracevic's [233] assessment of evaluation in IR, and Ingwersen and Järvelin's [139] book on information seeking and retrieval are great background reading for those interested in the evolution of IIR systems and evaluation.

In addition to the sources from the IIR and IR literature, a number of sources related to experimental design and statistics were instrumental in the development of this paper: Babbie [13], Cohen [56], Gravetter and Wallnau [110], Myers and Well [200], Pedhazur and Schmelkin [208], and Williams [296].

1.3 Outline of Paper

The paper begins with a description of IIR and short discussion of its history. The next section reviews general approaches to studying IIR. Although this paper focuses on laboratory evaluations, other approaches are discussed briefly. Section 5 introduces

² Six articles were published in ARIST with the title, Design and evaluation of information systems, during the period 1968–1975.

1.3 Outline of Paper 7

research basics — research questions, theory, hypotheses, and variables. More advanced readers might want to skip this section, although the discussion of levels of measurement is particularly important for understanding the later material on statistics. Basic experimental designs are introduced in Section 6, followed by a discussion of sampling (Section 7). Instruments and data collection techniques are then presented in Section 8, followed by a discussion of some of the more common measures used in IIR evaluation (Section 10). A lengthy section on data analysis is in Section 11; although some instruction regarding qualitative data analysis. This presentation starts with the basics of statistical data analysis, so advanced readers might want to skim parts of this section. Discussions of validity and reliability and research ethics are in Section 12. The paper concludes with future directions and challenges in Section 14.

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