

Information-Centered Research for Large-Scale Analyses of New Information Sources

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New mass publishing genres, such as blogs and personal home pages provide a rich source of social data that is yet to be fully exploited by the social sciences and humanities. Information-centered research (ICR) not only provides a genuinely new and useful information science research model for this type of data, but can also contribute to the emerging e-research infrastructure. Nevertheless, ICR should not be conducted on a purely abstract level, but should relate to potentially relevant problems.

Introduction

Information-centered research (ICR) is an e-research methodology that focuses on a new information source by (a) developing generic research tools that can be applied across a number of problem areas, and (b) identifying relevant research problems (Thelwall & Wouters, 2005). Information-centered research is deliberately open-ended in the knowledge domains that the relevant problems may derive from. Information-centered research stemmed from two issues:

1. The proliferation of different online information sources in the sense of large numbers of documents that could potentially be categorized in various meaningful ways (e.g., "Spanish university webs", "teenagers' MySpaces",

"all blogs"). This is not the e-science "data deluge" (Hey & Trefethen, 2003), but is more like an e-research "document deluge."

2. The difficulty in understanding the potential research relevance of new online information sources because of their often informal and innovative nature. Thus, there are many problems for which the new information sources seem a priori to be relevant, but for which they are later found to be inappropriate.

ICR researchers may contribute directly to knowledge in the form of publications or reports, or may attempt to deliver the information and associated processing techniques to appropriate knowledge domain experts to use for collaborative or solo research.

In contrast to ICR, the more standard problem-centered research (PCR) approach is to investigate whether an information source would aid in a specific research problem. For example, blogs might be analyzed to see whether blog discussion volume was a good indicator of public interest in political issues, news stories, or new book releases. Each of these three could form one traditional (PCR) investigation. In contrast, the ICR approach would be to investigate blogs to see what kinds of topics were discussed in them and then to direct blogs to those research issues that they could usefully address. More concretely, ICR can result in two different kinds of scholarly output: an ICR article or a PCR article. The ICR article would be an exploratory analysis of a new information source authored by the ICR researchers and not containing domain-specific research hypotheses or detailed theoretical frameworks. One ICR article, for

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example, explains how blogs can be a useful information source for any social sciences research touching on public opinion and describes a simple investigative method (Thelwall, 2007). This article does not contain research hypotheses or theoretical frameworks, however—at least one of which would normally be expected from social sciences research. In contrast, a PCR article derived from initial ICR research would contain domain-specific research hypotheses and would be authored by domain experts on their own, by domain experts in collaboration with ICR researchers, or by ICR researchers incorporating appropriate domain expertise. The PCR article would hence be a “normal” research article triggered by an ICR investigation that had identified the relevance of the information source to the domain.

Information-centered research is not only more open-ended than PCR, but has a different goal: directing information to appropriate problems rather than solving a given problem with the information. Claims 1 and 2 below were made in a previous article (Thelwall & Wouters, 2005). Here we expand the social sciences research claims in Claim 2 to include cultural research that might be described as humanities-oriented, and introduce Claims 3 and 4.

1. Information-centered research is more effective than PCR at identifying useful applications of new information sources, especially if conducted by information scientists.
2. Teams of information scientists should provide ICR hubs to assess new information sources for potential use in social sciences research.
3. Information-centered research is not covered by existing information science theories.
4. Information-centered research should not be conducted on a purely abstract level, separated completely from potentially relevant problems.

Finally, we discuss the future prospects for ICR to arm information scientists for seeking funding. The goal is not to create a new discipline from fields with a shared interest, as was achieved with communication sciences (Paisley, 1984), but for *some* information scientists to consciously provide an ICR service to the social sciences. The extent to which 1 and 2 above are desirable varies for different stakeholders in the system, and hence the likelihood of them being accepted will be contingent on incentive systems, economic factors, and institutional structures.

Information-Centered Research and Information Science Research Theories

Information-centered research is not covered by existing information science theories. The three most prominent information science theories are domain analysis, ASK (anomalous states of knowledge), and cognitive theories. These are all problem or “use” based, and do not provide generic tools for analyzing new information sources across problems.

Domain analysis (Hjørland & Albrechtsen, 1995) is useful to position ICR theoretically in respect to other Library and Information Science (LIS) activities. This theory posits

that information should be best understood and analyzed through the users, not as individuals, but as part of specialist knowledge domains. In particular, Hjørland (2002) proposes 11 specific competencies of information specialists that can apply to specific knowledge domains (e.g., indexing domain-specific document collections). In contrast, ICR is a cross-domain activity because the information source analyzed could be relevant to many different domains, and hence is not a form of domain analysis. A second point of differentiation is that ICR is not proposed as a core activity for general information scientists, but as a specialist activity. It is not unique in this because a large part of some other LIS fields, such as Information Retrieval and Bibliometrics, is general purpose rather than domain specific. For example, there are many bibliometricians in national research evaluation centers around the world.

One of the most influential information theories is *ASK*, which tries to move away from users explicitly formulating information needs. Instead, it focuses on the users’ problem statements, from which representations can be built of underlying anomalies in knowledge that could be resolved by information, for example by an information retrieval system delivering appropriate documents (Belkin, 1980). There are many other *cognitive theories*, including those taking into account the context rather than just the individual’s cognitive state (Ingwersen & Järvelin, 2005). More widely, there are many theories of information seeking and behavior that engage holistically with information-related behavior (e.g., Bates, 1989; Case, 2002; Foster & Ford, 2003). Information-centered research is not covered by cognitive theories, however, because the end recipients of the information are not seeking a solution to a specific problem, instead ICR researchers proactively offer them an information source to explore a problem that is relevant to them. Hence, the end user of ICR is not an actor in the process of solving the “problem” of the new information source.

Information-centered research could be seen as *information filtering* (Belkin & Croft, 1992) because the goal is to get information sources to appropriate users, except that information filtering systems typically deal with similar kinds of documents, routing them individually to appropriate recipients. Information science channels of information seeking research (e.g., Spink & Cole, 2001) has similarities with ICR in the sense that ICR is channeling data to potential users. Channeling research is the opposite of ICR, however, in the sense that it investigates the channels that users select to get the information that they need (e.g., formal vs. informal) whereas ICR provides a new channel (i.e., a research methodology) through which end users (i.e., non-ICR researchers) can be given access to data and methods relevant to their research field.

Information-centered research is similar to *data mining*, which focuses on extracting previously unknown patterns from databases, except that it is knowledge-domain independent, deals with unstructured collections of documents, and identifies the types of patterns that can be extracted rather than the actual patterns. The data mining literature does not seem to have developed ICR-relevant theories, however,

supplying instead prescriptive procedural models as aids to practice (e.g., Hand, Mannila, & Smyth, 2001, pp. 11–15; Pyle, 1999, p. 29).

The previous LIS research style most closely related to ICR is *literature-based discovery*, which develops algorithms to extract research hypotheses or connections from literature databases (e.g., Swanson & Smalheiser, 1997; Swanson, Smalheiser, & Bookstein, 2001). This is radically different from most information science research in that there is no necessary involvement of end users: in literature-based discovery, the research hypotheses are generated from the investigation and are its end product rather than the starting point (i.e., the opposite of standard PCR). This is similar to ICR in the sense that the end user is not predetermined, but would presumably be a scientist working in a knowledge domain that could assess the hypothesis suggested by the literature connections discovered by the system. Information-centered research is broader in focus than literature-based discovery, however. Information-centered research delivers data sources rather than individual facts or specific hypotheses, although general hypotheses may well arise out of the ICR data exploration. Importantly, ICR is proposed as a generic methodology for approaching emerging new information sources, rather than a methodology for more effectively employing a set of databases.

Finally, note that ICR has some parallels with Paisley's (1984) idea of "variable fields" that cut across other fields by focusing on a particular issue. Information-centered research, although not proposed as a field in its own right, can cut through a range of fields for which Internet-derived data is potentially useful.

Problem Abstraction in Information-Centered Research

Problem abstraction is a key theoretical issue for the validity of ICR as a research methodology. *How can the potential of new information sources as research objects be revealed if they are abstracted from the kind of use context brought to bear by problem-centered research?* In reality a "pure problem" unrelated to any information source does not exist, neither does "pure information" exist prior to interpretation. The act of distinguishing data is already loaded with interpretative frameworks and implicit assumptions. Information-centered research cannot, therefore, be built upon the idea of interpretation-free information. Rather, ICR emphasizes that the act of interpretation should occur at a higher level of abstraction, which takes the set of conceivable research questions from a variety of fields into account.

For PCR, note that in reality researchers normally have the flexibility to adapt their initial research questions to cope with unexpected results and it is arguably an important research skill to be able to report results while hiding preliminary wrong steps and unsuccessful suppositions (e.g., Latour & Woolgar, 1979). Nevertheless, a problem-based perspective on a new data source is at least constraining on the range of problem types that may be considered.

In terms of Stokes' (1997) types of research, ICR is a step away from the "use-inspired basic science" that a problem-oriented approach may take, towards the pure basic research quadrant because of its additional remove from a specific problem. Because of this shift, there is a related risk that ICR will reify information sources, especially if it becomes institutionalized as a recognized field activity, and so this problem will need to be guarded against by researchers. This is most relevant to ICR articles, as described in the Introduction. Knowledge of a range of social contexts is an important safeguard, perhaps through contact with a range of types of social issues or researchers from a variety of different fields.

Research Funding Objectives: A Wider Perspective

Even if the above argument for ICR is accepted within information science, it does not mean that it will be acted upon internationally. This depends upon various factors including the availability, capability, and willingness of sufficient information scientists in each country to play an information hub role, perhaps extending the library paradigm to active ICR. Some additional important factors will be considered here, which are predominantly external to the information science discipline.

The importance of ICR should be considered in the broader context of the informational turn in scientific knowledge creation (Wouters, 2006). The Human Genome Project is an example of the increasing importance of large-scale distributed data sets in scientific research practice. The development of "in-silico" experimentation and data production that the Human Genome Project innovated has been one of the factors leading to an exponential growth in the production of data in the life and biomedical sciences. Developments in the digitization of scientific outputs have resonated to other areas of scientific knowledge creation leading to what has been referred to as the "data deluge" (Hey & Trefethen, 2003).

E-research has been a programmatic response by governments and funding bodies to address the challenges and opportunities presented by the development and application of advanced distributed computing resources and infrastructure in the sciences, social sciences, and humanities. For example, in 2001 the United Kingdom initiated a £250 million, 5-year e-Science program to develop tools, technologies, and infrastructure to support multidisciplinary and distributed collaborations. Like the cyberinfrastructure program (Atkins, 2003) in the United States, the e-Science program in the UK embodies a vision that responds to the increasing needs of scientists for computationally intensive simulations, the management of ever-larger stores of data, and for shared access to expensive instruments.

The goals of e-Science have entailed a greater involvement of computer scientists in domain-specific problems, so it seems that e-Science is changing the roles and boundaries of computer science. This could indicate a Kuhnian (Kuhn, 1962) paradigm shift in computer science with the discipline fragmenting into interstitial applied areas between other

disciplinary boundaries. The recruitment and retention of programmers in e-Science, however, has been problematic largely because domain-specific problems do not constitute interesting computer science problems for developers.

The notion of e-Science is also being taken up in the humanities and social sciences. In 2004, the National Centre for e-Social Science (NCeSS) was set-up in the UK. The same year, the Dutch Royal Academy of Arts and Sciences decided to fund the Virtual Knowledge Studio for the Humanities and Social Sciences (www.virtuallyknowledgestudio.nl). The aim of NCeSS is to investigate how digital tools and infrastructure developed during the 5-year UK e-Science program can benefit the social science research community. In e-Science, infrastructure has been conceived as a generic resource that can support domain-specific applications of e-Science through the development of tools and middleware. The central metaphor for this infrastructure is an Internet-based "Grid"-like structure (Berman, Fox, & Hey, 2003), akin to a national utility system, such as the electricity grid.

One of the key issues for developing Internet-based services to support social and cultural researchers through the e-Science infrastructure has been the provision of access to data, combining data sets and developing tools for extracting information from them. Current projects include the development of tools for the distributed annotation of video-based data, Internet-based tools for visualizing geospatial data, the development of visual corpora and modeling and simulation tools. Although these data sets are not on the same scale as those being produced in the life and biomedical sciences, they do present access, processing, and curatorial issues.

Information-centered research is, therefore, of growing importance within the social sciences and to some extent the humanities, but thus far information science is not a discipline represented by activities and initiatives under the programmatic umbrella of e-research. The aims of ICR, e.g., the development of generic tools and the channeling of data and tools to relevant problem areas, fit well with the aims and direction of e-Social Science or e-research more broadly. Given the current climate in social science and the expertise of information science, benefit could be gained through the establishment of an ICR collaboratory that would provide tools, resources, and training, as well as foster collaboration among information scientists and support their interaction with social science and humanities research more broadly. The establishment of such a collaboratory would also contribute to an increase in the degree of technical-certainty within information science through the diffusion of techniques and tools both within the discipline and across related fields.

Conclusion

The emergence of new information sources associated with new technologies seems set to continue and expand. Hence, there will probably be many initially plausible social science and humanities applications for data collected on a large scale from the new sources. This has created the need

for a new information-centered style of research that seeks to identify which research problems the data sources may be useful for rather than assessing the data for a given research problem. Information science as a discipline is most suited to this role because ICR can most easily be conceptualized as being within its disciplinary boundaries. Moreover, its combination of computing skills and contact with a range of social science and humanities fields gives many information scientists the necessary skills. Although ICR can be conducted by individual researchers and research groups, information scientists should organize and apply for funding for ICR because it is beneficial to the social sciences and humanities in general. Funded ICR hubs should probably take the form of national centers or, more informally, of individual research programs designed to interface with existing national networks and centers, such as the UK's National Centre for e-Social Science.

The extent to which information-centered research is adopted on an international scale will be determined by factors including the success of early initiatives and the support of existing senior information scientists. The extent to which information scientists can play a role at the national level of brokering new information sources will be affected by political and practical considerations, determined perhaps by the influence of information science among senior national social scientists and the skills of national information scientists to persuade funding agencies that this will support wider social science goals. We wrote this article with the primary purpose of arming information scientists for this task.

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