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**Federated Search** 

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## Federated Search

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#### **Abstract**

Federated search (federated information retrieval or distributed information retrieval) is a technique for searching multiple text collections simultaneously. Queries are submitted to a subset of collections that are most likely to return relevant answers. The results returned by selected collections are integrated and merged into a single list. Federated search is preferred over centralized search alternatives in many environments. For example, commercial search engines such as Google cannot easily index uncrawlable hidden web collections while federated search systems can search the contents of hidden web collections without crawling. In enterprise environments, where each organization maintains an independent search engine, federated search techniques can provide parallel search over multiple collections.

There are three major challenges in federated search. For each query, a subset of collections that are most likely to return relevant documents are selected. This creates the *collection selection* problem. To be able to select suitable collections, federated search systems need to acquire some knowledge about the contents of each collection, creating

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the collection representation problem. The results returned from the selected collections are merged before the final presentation to the user. This final step is the result merging problem.

The goal of this work, is to provide a comprehensive summary of the previous research on the federated search challenges described above.

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# 1

## Introduction

Internet search is one of the most popular activities on the web. More than 80% of internet searchers use search engines for finding their information needs [251]. In September 1999, Google claimed that it received 3.5 million queries per day. This number increased to 100 million in 2000, and has grown to hundreds of millions since. The rapid increase in the number of users, web documents and web queries shows the necessity of an advanced search system that can satisfy users' information needs both effectively and efficiently.

Since Aliweb [150] was released as the first internet search engine in 1994, searching methods have been an active area of research, and search technology has attracted significant attention from industrial and commercial organizations. Of course, the domain for search is not limited to the internet activities. A person may utilize search systems to find an email in a mail box, to look for an image on a local machine, or to find a text document on a local area network.

<sup>&</sup>lt;sup>1</sup>http://www.google.com/press/pressrel/pressrelease4.html, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>2</sup>http://www.google.com/corporate/history.html, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>3</sup> http://www.comscore.com/Press\_Events/Press\_Releases/2010/8/comScore\_Releases\_ July\_2010\_U.S.\_Search\_Engine\_Rankings, accessed on 17 Aug 2010.

#### 2 Introduction

Commercial search engines use programs called crawlers (or spiders) to download web documents. Any document overlooked by crawlers may affect the users perception of what information is available on the web. Unfortunately, search engines cannot easily crawl documents located in what is generally known as the hidden web (or deep web) [206]. There are several factors that make documents uncrawlable. For example, page servers may be too slow, or many pages might be prohibited by the robot exclusion protocol and authorization settings. Another reason might be that some documents are not linked to from any other page on the web. Furthermore, there are many dynamic pages — pages whose content is generated on the fly — that are crawlable [206] but are not bounded in number, and are therefore often ignored by crawlers.

As the size of the hidden web has been estimated to be many times larger than the number of visible documents on the web [28], the volume of information being ignored by search engines is significant. Hidden web documents have diverse topics and are written in different languages. For example, PubMed<sup>4</sup> — a service of the US national library of medicine — contains more than 20 million records of life sciences and biomedical articles published since the 1950s. The US census Bureau<sup>5</sup> includes statistics about population, business owners and so on in the USA. There are many patent offices whose portals provide access to patent information, and there are many other websites such for yellow pages and white pages that provide access to hidden web information.

Instead of expending effort to crawl such collections — some of which may not be crawlable at all — federated search techniques directly pass the query to the search interface of suitable collections and merge their results. In federated search, queries are submitted directly to a set of searchable collections — such as those mentioned for the hidden web — that are usually distributed across several locations. The final results are often comprised of answers returned from multiple collections.

 $<sup>^4\, {\</sup>tt http://www.ncbi.nlm.nih.gov/entrez/query.fcgi?db=PubMed}, accessed on 17 \ {\tt Aug} \ 2010.$ 

<sup>&</sup>lt;sup>5</sup> http://www.census.gov, accessed on 17 Aug 2010.

3

From the users' perspective, queries should be executed on servers that contain the most relevant information. For example, a government portal may consist of several searchable collections for different organizations and agencies. For a query such as 'Administrative Office of the US Courts', it might not be useful to search all collections. A better alternative may be to search only collections from the www.uscourts.gov domain that are likely to contain the relevant answers.

However, federated search techniques are not limited to the web and can be useful for many enterprise search systems. Any organization with multiple searchable collections can apply federated search techniques. For instance, Westlaw<sup>6</sup> provides federated search for legal professionals covering more than 30,000 databases [59, 60, 61]. The users can search for case law, court documents, related newspapers and magazines, public records, and in return, receive merged results from heterogeneous sources. FedStats<sup>7</sup> is an online portal of statistical information published by many federal agencies. The crawls for the original centralized search in FedStats could be updated only every three months. Therefore, a federated search solution was requested and this was the main focus of the FedLemur project [13].<sup>8</sup> FedStats enables citizens, businesses, and government employees to find useful information without separately visiting web sites of individual agencies.

Federated search can be also used for searching multiple catalogs and other information sources. For example, in the Cheshire project, many digital libraries including the UC Berkeley Physical Sciences Libraries, Penn State University, Duke University, Carnegie Mellon University, UNC Chapel Hill, the Hong Kong University of Science and Technology and a few other libraries have become searchable through a single interface at the University of Berkeley. Similarly, The European Library provides a federated search solution to access the resources of 47 national libraries.

 $<sup>^6\,\</sup>rm http://www.thomsonreuters.com/products\_services/legal/legal\_products/393832/Westlaw, accessed on 17 Aug 2010.$ 

<sup>&</sup>lt;sup>7</sup>http://search.fedstats.gov, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>8</sup> FedStats search is currently powered by google.com.

<sup>&</sup>lt;sup>9</sup>http://cheshire.berkeley.edu/, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>10</sup> http://search.theeuropeanlibrary.org/portal/en/index.html, accessed on 17 Aug 2010.

#### 4 Introduction

#### 1.1 Federated Search

In federated search systems,<sup>11</sup> the task is to search a group of independent collections, and to effectively merge the results they return for queries.

Figure 1.1 shows the architecture of a typical federated search system. A central section (the *broker*) receives queries from the users and sends them to collections that are deemed most likely to contain relevant answers. The highlighted collections in Figure 1.1 are those selected for the query. To route queries to suitable collections, the broker needs to store some important information (summary or representation) about available collections. In a *cooperative* environment, collections inform brokers about their contents by providing

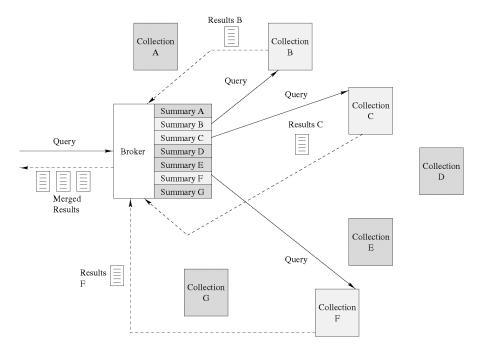


Fig. 1.1 The architecture of a typical federated search system. The broker stores the representation set (the summary) of each collection, and selects a subset of collections for the query. The selected collections then run the query and return their results to the broker, which merges all results and ranks them in a single list.

<sup>&</sup>lt;sup>11</sup> Also referred to as distributed information retrieval (DIR).

information such as their term statistics. This information is often exchanged through a set of shared protocols such as STARTS [111] and may contain term statistics and other metadata such as collection size. In uncooperative environments, collections do not provide any information about their contents to brokers. A technique that can be used to obtain information about collections in such environments is to send sampling (probe) queries to each collection. Information gathered from the limited number of answer documents that a collection provides in response to such queries is used to construct a representation set; this representation set guides the evaluation of user queries and ranking collections. The selected collections receive the query from the broker and evaluate it on their own indexes. In the final step, the broker ranks the results returned by the selected collections and presents them to the user.

Federated search systems therefore need to address three major issues: how to represent the collections, how to select suitable collections for searching; and how to merge the results returned from collections. 12 Brokers typically compare each query to representation sets — also called summaries [138] — of each collection, and estimate the goodness of the collection accordingly. Each representation set may contain statistics about the lexicon of the corresponding collection. If the lexicon of the collections is provided to the central broker that is, if the collections are cooperative — then complete and accurate information can be used for collection selection. However, in an uncooperative environment such as the hidden web, the collections need to be sampled to establish a summary of their topic coverage. This technique is known as query-based sampling [42] or query probing [116].

Once the collection summaries are generated, the broker has sufficient knowledge for collection selection. It is usually not feasible to search all collections for a query due to time constraints and bandwidth restrictions. Therefore, the broker selects a few collections that are most likely to return relevant documents based on their summaries. The selected collections receive the query and return their results to the broker.

<sup>&</sup>lt;sup>12</sup>We briefly describe other common challenges such as building wrappers in Section 2.

#### 6 Introduction

Result merging is the last step of a federated search session. The results returned by multiple collections are gathered and ranked by the broker before presentation to the user. Since documents are returned from collections with different lexicon statistics and ranking features, their scores or ranks are not comparable. The main goal of result merging techniques is computing comparable scores for documents returned from different collections, and ranking them accordingly.

#### 1.2 Federated Search on the Web

The most common forms of federated search on the web include *vertical* search, *peer-to-peer* (P2P) networks, and *metasearch* engines. Vertical search — also known as aggregated search — blends the top-ranked answers from search verticals (e.g., images, videos, maps) into the web search results. P2P search connects distributed peers (usually for file sharing), where each peer can be both *server* and *client*. Metasearch engines combine the results of different search engines in single results lists. Depending on the query, metasearch engines can select different engines for blending.

#### 1.2.1 Vertical (aggregated) Search

Until recently, web search engines used to only show text answers in their results. Users interested in other types of answers (e.g., images, videos, and maps), had to directly submit their queries to the specialized *verticals*.

In 2000, the Korean search engine Naver<sup>13</sup> introduced comprehensive search and blended multimedia answers in their default search results. In May 2007, Google launched aggregated search (universal search) "to break down the walls that traditionally separated [their] various search properties and integrate the vast amounts of information available into one simple set of search results".<sup>14</sup> In aggregated search, the top-ranked answers from other information sources (e.g., image vertical) are merged with the default text results. Universal

<sup>&</sup>lt;sup>13</sup> http://www.naver.com, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>14</sup> http://googleblog.blogspot.com/2007/05/universal-search-best-answer-is-still. html, accessed on 17 Aug 2010.















Dog - Wikipedia, the free encyclopedia The dog is a domesticated subspecies of the

member of the Canidae family of the order Car is used for both feral and pet varieties. The dor en.wikipedia.org/wiki/Dog - 245k - <u>Cached</u>

Dog Supplies, Dog Beds, Toys & Treat Dog supplies from dog.com includes a huge var discounted prices. Dog.com satisfies your dog su Dog - Wikipedia, the free encyclopedia form of the Gray Wolf, a member of the Canidae fa en.wikipedia.org/wiki/Dog

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Dog - Wikipedia, the free encyclopedia The dog (Canis lupus familiaris, [2] pronounced / Best Friend) is a domesticated subspecies of the Etymology and related ... Taxonomy · History ar en.wikipedia.org/wiki/Dog · Enhanced view

Dog (zodiac) - Wikipedia, the free er The Dog ( 绚 ) is one of the 12-year cycle o to the Chinese calendar. The Year of the Do en.wikipedia.org/wiki/Dog\_(zodiac) - Cache

<u>Dog Supplies, Dog Beds, Toys & Treats</u> .

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Fig. 1.2 The outputs of three major search engines for the query "dog". The top-ranked answers from the image vertical are blended in the final results.

search substantially increased the traffic of Google's non-text search verticals. For instance, the traffic of Google Maps increased by more than 20%. <sup>15</sup> Since then, all other major search engines such as Yahoo! <sup>16</sup> and Bing have adopted aggregated search techniques. Figure 1.2 shows the results returned by three major search engines for the query "dog". It can be seen that all search engines merge some image answers along with their text results.

An aggregated search interaction consists of two major steps: vertical selection and merging. In the first step, the verticals relevant to the query are selected. A few examples of common verticals that are utilized by current search engines are: images, videos, news, maps, blogs, groups and books. The answers returned from the selected verticals are integrated with the default web results in the merging step.

Aggregated search was discussed in a workshop at SIGIR 2008 [191] as a promising area of research. Less than a year after, Diaz [77] proposed a click-based classifier for integration of news answers into web search results — as the first large-scale published study on aggregated

<sup>&</sup>lt;sup>15</sup> http://searchengineland.com/070608-091826.php, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>16</sup> Yahoo! has recently launched a new website (http://au.alpha.yahoo.com/) that applies aggregated search on a greater number of data sources.

#### 8 Introduction

search that won the best paper award at WSDM 2009.<sup>17</sup> Arguello et al. [9] proposed a classification-based method for vertical selection. The authors trained a classifier with features derived from the query string, previous query logs, and vertical content. They tested their techniques on a framework of 18 verticals, for which they won the best paper award at SIGIR 2009.<sup>18</sup> Diaz and Arguello [78] showed that integrating users feedback such as clicks can significantly improve the performance of vertical selection methods.

Aggregated search is a new area of research, and has opened several directions for future work; what search verticals shall be selected for a query? How can the results of different verticals be merged into a single list? Do users prefer aggregated search results? How aggregated search changes users' search behaviors?

#### 1.2.2 Peer-to-peer Networks

Lu [168] showed that the search task in a peer-to-peer network is closely related with the research topic of federated search. A peer-to-peer network (P2P) consists of three main types of objects: information providers, information consumers, and a search mechanism that retrieves relevant information from providers for consumers.

The P2P network architectures can be divided into four categories: broker-based P2P networks (e.g., the original Napster music file-sharing system<sup>19</sup>) have a single centralized service that also contains document lists shared from peer nodes. The centralized service responds to queries from consumers by returning the pointers of relevant documents. In Decentralized P2P architectures such as Gnutella  $v0.4^{20}$  each peer node can serve as both provider and consumer. Hierarchical P2P architectures such as, Gnutella  $v0.6^{21}$ , Gnutella $^{22}$ , BearShare $^{23}$  and

 $<sup>^{17}\,\</sup>mathrm{http://www.wsdm2009.org,}$  accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>18</sup> http://sigir2009.org, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>19</sup> http://www.napster.com, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>20</sup> http://rfc-gnutella.sourceforge.net/developer/stable/index.html, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>21</sup> http://rfc-gnutella.sourceforge.net/src/rfc-0\_6-draft.html, accessed on 17 Aug 2010.

 $<sup>^{22}\,\</sup>mathrm{http://g2.trillinux.org/index.php?title=Main.Page},\,\mathrm{accessed}$  on 17 Aug 2010.

<sup>&</sup>lt;sup>23</sup> www.bearshare.com, accessed on 17 Aug 2010.

Swapper.NET<sup>24</sup> utilize local directory services that often work with each other for routing queries and merging search results. Structuredbased P2P networks such as CAN [209] and Chord [252] often use distributed hash tables for searching and retrieving files.

Peer-to-peer search has to address similar problems to federated search; specifically, representing useful contents of peer nodes and local search directories (collection representation), routing queries to relevant nodes or directories (collection selection), and combining search results (result merging). Early P2P networks focused on simple query routing methods such as flooding and simple merging methods based on the frequency of term matching or content-independent features. More recent studies [168, 170, 171] explored full-text representations with content-based query routing and relevance-based results integration. Therefore, improving collection representation, collection selection and result merging in federated search can have a direct impact on the quality of search in P2P networks.

#### 1.2.3 **Metasearch Engines**

Metasearch engines provide a single search portal for combining the results of multiple search engines [186]. Metasearch engines do not usually retain a document index; they send the guery in parallel to multiple search engines, and integrate the returned answers. The architecture details of many metasearch engines such as Dogpile, <sup>25</sup> MetaCrawler [219, 220], AllInOneNews [164], ProFusion [103, 104], Savvysearch [81], iXmetafind [120], Fusion [249], and Inquirus [108, 158] have been published in recent years.

Figure 1.3 shows the answers returned by Metacrawler [220] for the query "federated search". It can be seen that the presented results are merged from different search engines such as Yahoo! and Google, Ask and Bing.

Compared to the centralized search engines, metasearch engines have advantages such as broader coverage of the web and better search scalability [185]. The index and coverage of commercial search engines

<sup>&</sup>lt;sup>24</sup>http://www.revolutionarystuff.com/swapper, accessed on 17 Aug 2010.

<sup>&</sup>lt;sup>25</sup>http://www.dogpile.com/dogpile/ws/about?\_IceUrl=true, accessed on 17 Aug 2010.

#### 10 Introduction

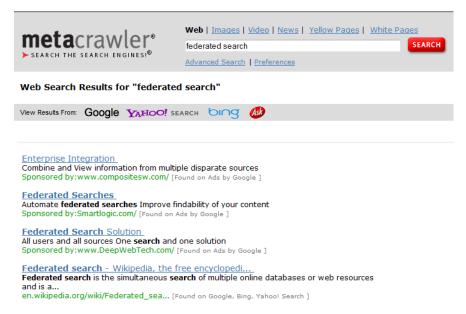


Fig. 1.3 The results of the query "federated search" returned from Metacrawler [220] metasearch engine. It can be seen that the results are merged from different sources such as Google, Yahoo! and Bing search engines.

are substantially different. Many of the pages that are indexed by one search engine may not be indexed by another search engine. Bar-Yossef and Gurevich [22] suggested that the amount of overlap between the indexes of Google and Yahoo! is less than 45%.

### 1.3 Outline

This paper presents a comprehensive summary of federated search techniques. This section provides a road map for the remaining sections.

In Section 2, we compare the collection representation sets (summaries) in cooperative and uncooperative environments. We also discuss several approaches for improving incomplete summaries, including the previous research on estimating the size of collections from sampled documents. We end this section by describing *wrappers*, the programs used for interacting with the interfaces of hidden-web collections, and summarizing available techniques for evaluating the quality of collection summaries.

In Section 3, we compare different collection selection methods by categorizing the current techniques into two main groups; lexicon-based, and document-surrogates. The former group mainly consists of techniques that are more suitable for cooperative environments, while the latter group includes collection selection methods based on incomplete sampled documents. We also provide an overview of previous work on query-classification in the context of federated search. In the last section of this section, we discuss the common metrics for evaluating the effectiveness of collection selection methods.

In Section 4, we discuss several federated search merging techniques. We also provide a brief summary of commonly used blending techniques in closely related areas of data fusion and metasearch.

In Section 5, we discuss common datasets used for evaluating the federated search techniques. This is important because relative performance of federated search methods can vary significantly between different testbeds [86, 242].<sup>26</sup>

Finally, in Section 6 we present our conclusions and discuss directions for future work.

 $<sup>^{26}</sup>$  We use the term testbed to refer to a set of collections that are used together for federated search experiments (collection selection and result merging).

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