

Link Analysis and Site Structure in Information Retrieval

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Abstract: Link analysis is the most important application of web structure mining and serves as a new knowledge source in web information retrieval. However, the mono-dimensional analysis of links neglects many other structural aspects. The results presented in this article show that the structure of a site affects the in-links for its pages. Link analysis algorithms need to be refined in order to account for that fact.

1. Introduction

The Internet poses several new challenges for information retrieval and, at the same time, offers additional knowledge sources. One of the main problems for search engines is the heterogeneous quality of internet pages [HM02]. The common approach to automatically measure the quality of a page has been link analysis. The number of links pointing to a page are considered as main quality indicator. A large number of algorithms for link analysis has been developed [He00]. The most well known are probably the PageRank algorithm and its variants [Ha02, JW03]. However, link analysis has several shortcomings.

The assignment of links is a social process leading to remarkable global patterns. The number of in-links for a web page follows a power law distribution [DK01]. In such a distribution, the median value is much lower than the average. That means, many pages have few in-links while few pages have an extremely high number of in-links. The quality or authority value derived from the link-structure needs to be aggregated with the retrieval ranking. The power law distribution of authority values makes the value of some pages very dominant while other have little influence.

The influence of the power law is also visible for popularity measure in other social networks [Ba02]. It indicates that web page authors choose the web sites they link to without a thorough quality evaluation. Much rather, they act according to economic principles and invest as little time as possible for their selection. As a consequence, social actors in networks rely on the preferences of other actors. Pages with a high in-link degree are more likely to receive further in-links than other pages [PF02]. Another reason for setting links is thematic similarity. A co-citation matrix between web pages of different topics shows that most links are based on topical similarity [CJ02]. Definitely, quality assessment is not the only reason for setting a link.

Link analysis in information retrieval does not consider site structure. An analysis including the hierarchical position of a page within the site structure revealed an important correlation. It showed that that pages low in the hierarchy are less likely to receive in-links than top level pages like home pages [Ma02]. This analysis was based on internet catalogues. In this paper, the study is extended to a crawl of non-catalogue pages. The same trend was identified. However, different parameters are necessary to describe the difference between catalogue and non-catalogue pages. Further structural analysis hints that the hierarchical position has less influence on other page specific features like the internal structure. The internal structure is also neglected by link analysis, however, it has been of great interest in XML retrieval [FG01].

Large scale evaluation of web information retrieval is carried out within TREC (Text Retrieval Conference, <http://trec.nist.gov>). TREC provides a testbed for information retrieval experiments. The annual event is organized by the National Institute for Standards and Technology (NIST) which maintains a large collection of documents. Research groups apply their retrieval engines to this corpus and optimize them with results from previous years. They send their results to NIST, where the relevance of the retrieved documents is assessed. A few years ago, a web track has been introduced, where a large snapshot of the web forms the document collection. In this context, link based measures have been compared with standard retrieval rankings. The results show that the consideration of link structure does not lead to better retrieval performance. Only for the home page finding task, link based authority measures like the PageRank algorithm have led to an improvement [Ha01, GS01, Ya01, Ma03]. As a consequence, further refinement of link based algorithms is necessary.

2. Site Structure and In-Links

Web directories or internet catalogues are important services for the orientation in the internet. They usually intend to topically organize information sources and to introduce a certain level of quality control. Human editors monitor the web, evaluate pages and comment on sites. They arrange internet resources in a topical hierarchy.

One experiment presented in [Ma02] focused on the question to which catalogue pages web authors tend to set their links. Are they likely to point to a general high level entry page of a catalogue? Or do they value the work of the editing staff which may have selected high quality sites for their special topic? In the latter case, more links to lower levels of the hierarchy would be expected. The work presented in [Ma02] is extended to non-catalogue pages and page structure which is discussed in chapter 3.

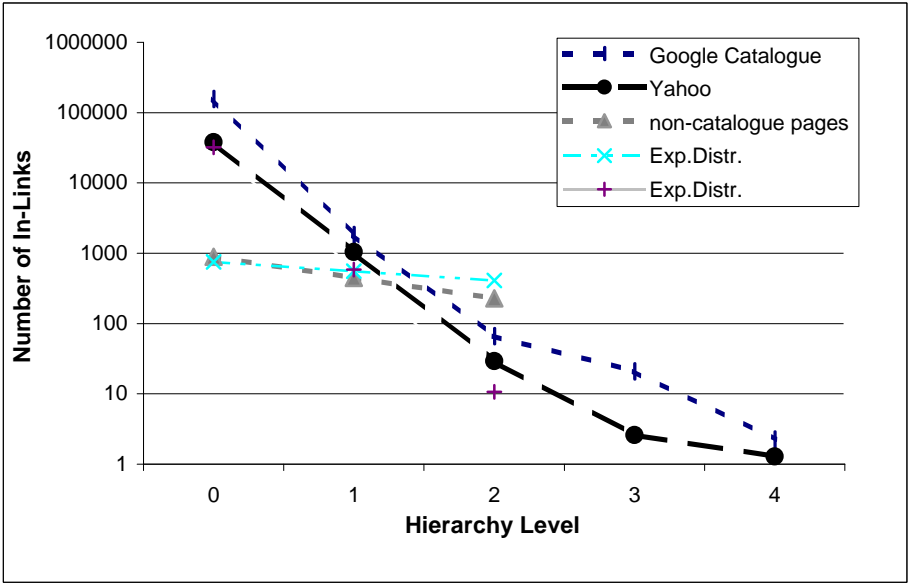


Figure 1: Relation between In-Links and Hierarchical Position of a Page

2.1 Experiment and Results

The experiments presented focus on two German web catalogues (German version of the Google directory and German Yahoo catalogue). The pages of these web directories as well as the pages they point to were analyzed. A document object model (DOM) of each page was derived. In addition, both Google and Altavista were queried about the number of in-links to each of the pages. Some 3000 pages of the Google catalogue, some 4000 pages of the Yahoo directory and 8000 non-catalogue pages from search engine results were parsed.

The results show a dramatic decrease in the number of links for lower hierarchy levels. The lower the pages are positioned in the site hierarchy, the less likely they are to receive in-links. The relationship between the average number of in-links for a page and its position in the hierarchy are shown in figure 1. There also seems to be a difference between the catalogue pages and non-catalogue pages. Assuming an exponential distribution, the relation for catalogue pages can be approximated by an exponent of 4 whereas for the non-catalogue pages, an exponent of 0.3 results in a good approximation.

Another analysis of the non catalogue page crawl is shown in figure 2. The in-link degree is shown in relation to the percentage of pages with that in-link degree. It is clearly visible that the pages on different hierarchical levels exhibit a different cumulative distribution. Especially the pages on level 0 which are the home pages of the sites have a considerable higher probability of receiving in-links than other pages.

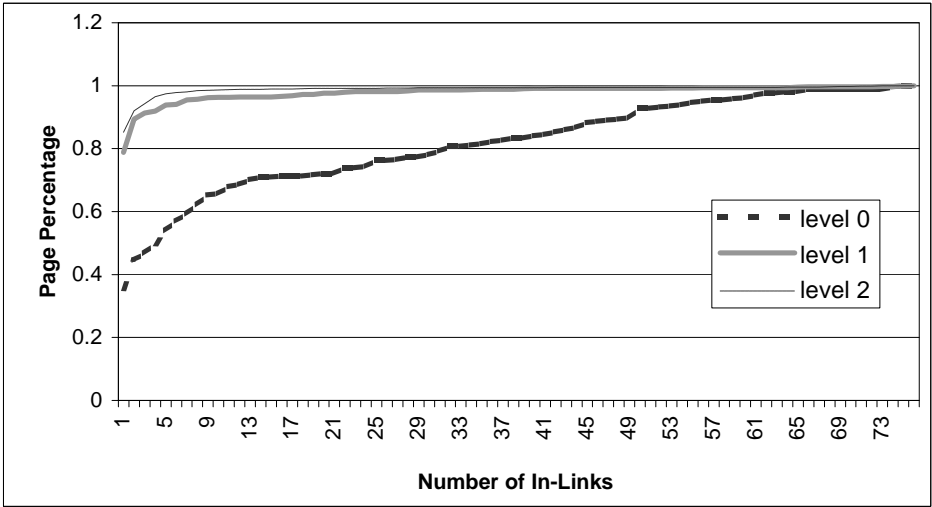


Figure 2: Cumulative Distribution for In-Links and Hierarchical Position of a Page

2.2 Consequences for link analysis algorithms

These results should be considered by the developers of web search engines. A more adequate exploitation of link structure may result in better retrieval results. Currently, link-based measures do not take into account the hierarchical position of a page. However, a page deep in the hierarchy which receives relatively many back-links deserves to be assigned a higher authority value.

Furthermore, the analysis shows how web page authors assume, that catalogue pages are used best. They prefer the presence of further options over pointing to a very specific page. Rather than targeting pages with a narrow topical focus on lower hierarchical levels, they infer that users will benefit from further options for browsing. Web page authors stress the importance of navigation by browsing as information finding strategy in human-computer interaction.

The experiments presented here also shed light on limits of the automatic evaluation of catalogue sites. This is especially interesting for systems which automatically search for the most authoritative catalogue page for a given topic. These would need to observe the hierarchical position of a topic within a catalogue.

3. Page Structure

Further structural analysis of the pages tried to reveal whether the hierarchical position has also effects on the structure of a page. If that is the case, home pages would be structurally different from other pages. This fact may bias their indexing results in search engines. This may ultimately lead to higher in-link counts. In that case, the results from the previous chapter may also have structural reasons. However, this could not be verified.

The analysis of non-catalogue pages was extended to page properties. We extracted the number of nodes in the document object model (DOM) derived from the page, the number of tables and the number of meta tags. The two first parameters are indicators for the structural complexity of a page whereas the number of meta tags indicates the extent to which the author aids indexing. These parameters were compared to both the in-link degree and the hierarchical position measured by the crawl order from the home pages.

An analysis of the pages shows that pages on higher levels in the site structure tree tend to have more DOM elements with a lower deviation. They also seem to have more tables. However, these trends are very weak. The study needs to be extended to a larger number of pages and sites.

Table 1: Results of the Structural Analysis

Hierarchy Level	<i>Average</i>		
	Nr DOM Elements	Nr MetaTags	Nr Tables
0	295.2	8.7	13.6
1	292.8	11.9	10.9
2	252.5	9.1	9.5
Hierarchy Level	<i>Standard Deviation</i>		
	Nr DOM Elements	Nr MetaTags	Nr Tables
0	382.2	10.1	23.4
1	429.3	11.7	17.9
2	470.3	8.1	28.3

A correlation analysis between both crawl order and in-link degree to the other parameters revealed no strong correlation. Only the number of tables and the number of DOM elements in a page correlated with a value of 0.24 and 0.21 respectively to the number of in-links.

4. Outlook

Link analysis algorithms still suffer from many shortcomings. Some of them are presented in chapter 1. In addition, the analysis in [Ma02], revealed no correlation between the link based authority of a catalogue page and the link based authority of its entries. Therefore, a quality definition for web pages should not rely on one of one parameter only. It is necessary to find more reliable metrics for the quality of a web page which can be derived automatically.

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