

Searching for

Authority on the WWW

(Not just relevance or popularity...)

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Sources of Information on the WWW

- Textual content
- Images, sounds, multimedia content
- Hyperlink digraph (network structure)
 - Pages are vertices, links are arcs
 - Refinement: URLs are nodes

Nature of the WWW

- Local organization may be a priori.
- Global organization “utterly unplanned.”
- Billions of agents (users, spiders).
- Millions of publishers.
- Trillions of vertices, at least.
- Too big for simple search.

Searching the WWW

- **Quality** of search method defined by utility of results.
- **Utility** requires human evaluation.
- Utility is closely correlated to **relevance**.
- Algorithmic and storage **efficiency** are a concern: interactivity/response time.

Search: Queries

- Searches are initiated by a user-supplied **query**.
- Three types of queries discussed:
 - **Specific** queries.
 - **Broad-topic** queries.
 - **Similar content** queries.

Search: Problems.

- Specific queries: **Scarcity**.
 - Required information is scarce and pages are hard to find.
- Broad-topic queries: **Abundance**.
 - We only want the **authoritative** pages.
(i.e.: Wikipedia itself, not ad-clones.)

Search: Authorities

- Possible measures of authority:
 - **Frequency** of search term on page.
 - Problem: **Self-descriptive**.
 - **Popularity** of page. (rank by links in)
 - Problem: Obfuscation by **hubs**.
 - Analysis of link structure...

Hyperlinks

- Claim:
Hyperlinks indicate **conferred authority**.
- Claim:
Hyperlinks solve self-descriptive problem.
- What about navigational links?
- What about paid advertisements?

Popularity

- In some cases, most authoritative pages aren't self-descriptive.
- Universally popular pages would be considered highly authoritative w.r.t any query string, when they are not.

Step 1: Constructing Focused Subgraph

- Obtain root set, **R**, from textual search.
 - Relatively small, rich in relevant pages, but doesn't contain most or many of strongest authorities.
 - Extremely few intra-R links.
- Obtain base set, **S**, from R by adding any pages pointing to or pointed from R.

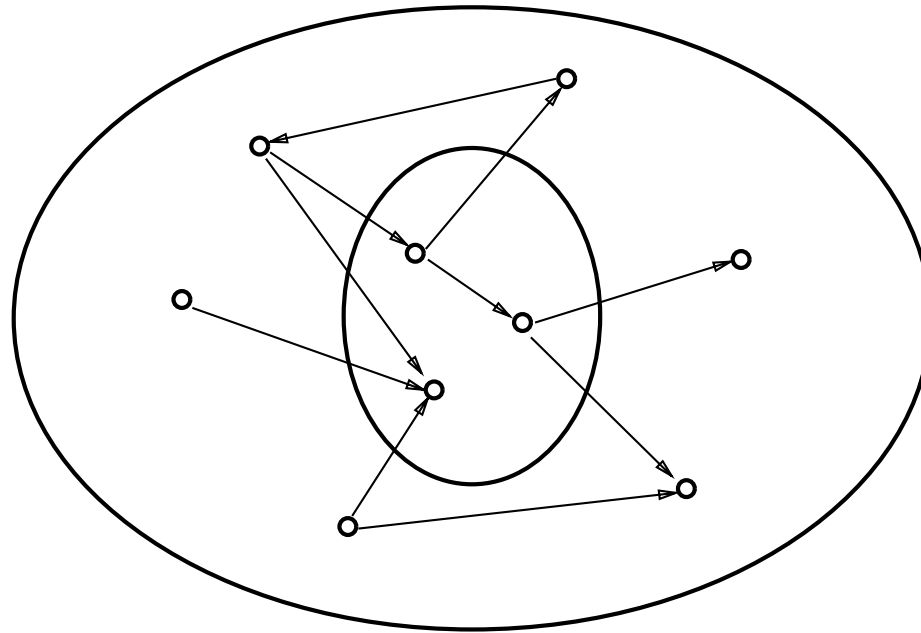


Figure 1: Expanding the root set into a base set.

$$R \rightarrow S$$

- What about navigational links?
 - Transverse vs. intrinsic links.
 - Delete all intrinsic links.
 - Caveats?
- What about “Google Bombing”?
 - Set limitations on in-degree or out-degree on a per-domain basis.

Step 2: Computing Hubs and Authorities

- Given our focused subgraph G , now what?
 - Popularity ranking by in-degree?
 - Popularity \neq relevance.
 - **Hub**: links to multiple relevant authorities.
 - **Authorities**: high in-degree and overlap.
 - Hubs & Authorities: Mutually reinforcing.

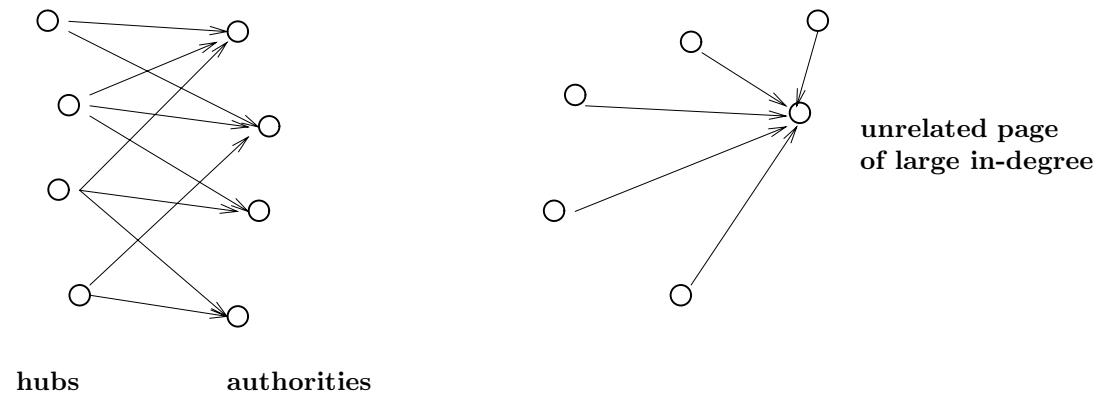


Figure 2: A densely linked set of hubs and authorities.

Iterative Algorithm

- Subgraph $G = (V, A)$.
- Normalized weights, $x_{\langle p \rangle}$ & $y_{\langle p \rangle}$.
- Update operations, I & O.
- Mutually reinforcing:
 - I: $x_{\langle p \rangle} = \sum y_{\langle q \rangle} \forall q : (q, p) \in A$.
 - O: $y_{\langle p \rangle} = \sum x_{\langle q \rangle} \forall q : (p, q) \in A$.

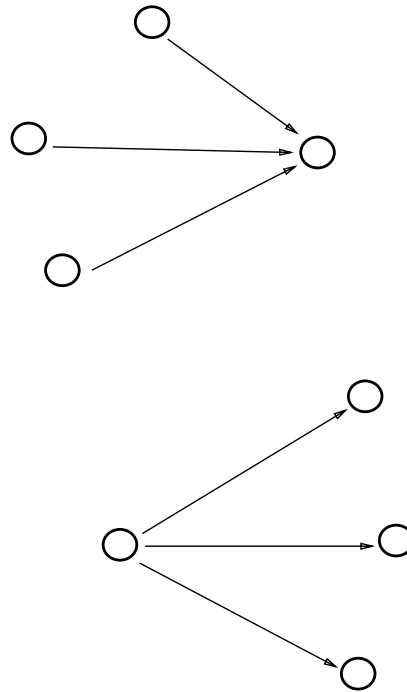


Figure 3: The basic operations.

I & O

- x is a vector containing all $x_{<p>}$
- y is a vector containing all $y_{<p>}$
- $\text{Iterate}(k)$: apply I & O and normalize.
- $\text{Filter}(c)$: obtain c largest coordinates.
- Optimization of k is trivial:
 - x and y converge eventually. (3.1)

Iterate(G, k)

G : a collection of n linked pages

k : a natural number

Let z denote the vector $(1, 1, 1, \dots, 1) \in \mathbf{R}^n$.

Set $x_0 := z$.

Set $y_0 := z$.

For $i = 1, 2, \dots, k$

 Apply the \mathcal{I} operation to (x_{i-1}, y_{i-1}) , obtaining new x -weights x'_i .

 Apply the \mathcal{O} operation to (x'_i, y_{i-1}) , obtaining new y -weights y'_i .

 Normalize x'_i , obtaining x_i .

 Normalize y'_i , obtaining y_i .

End

Return (x_k, y_k) .

Iterate

$\text{Filter}(G, k, c)$

G : a collection of n linked pages

k, c : natural numbers

$(x_k, y_k) := \text{Iterate}(G, k)$.

Report the pages with the c largest coordinates in x_k as authorities.

Report the pages with the c largest coordinates in y_k as hubs.

Filter

Method Quirks

- Textual search as black box.
- Only probabilistically global.
- Does not address scarcity problem.

Similar-Page Queries

- “similar:www.example.com”
- Very little modification necessary!
- Obtain root set from in-pages search.
 - $R = t$ pages pointing to p .
- In-degree still not a good ranking.

Related Work

- Standing in social networks.
- Influence in scientific citation networks.
- PageRank. (i.e.: WWW indices, no hubs)

Multiple Sets of H&A

- What about ambiguous query terms? (Terms with several meanings.)
- What about different contexts?
- What about polarized issues? (Groups that won't link to one another, but are debating the same topic.)
- Clusters exist.

Diffusion and Generalization

- **Diffusion:** pages corresponding to “broader” topics than the query string are returned, or reference page has insufficient in-degree.
 - Was the query string too specific?
- Possible solutions?
 - Non-principal eigenvectors.
 - Textual approaches (i.e.: term-matching)

Conclusions

- **Abundance** problem is harder each day.
 - Calls for search engines to consider more than simple relevance and clustering.
- Growth of WWW makes **indexing** harder.
- WWW search results must be **global**,
WWW search process doesn't have to be.
- **Quality** of results is critical, more so as the WWW grows and becomes polluted.

Conclusions

- WWW is social.
(Social organization is represented.)
- Further avenues:
 - User traffic pattern analysis.
 - Eigenvector-based heuristics. (LSA)
 - Link-based methods for other queries.