#### T-61.6040 Special Course in Computer and Information Science IV: Information Networks

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- S.Brin, L.Page: The Anatomy of a Large-Scale Hypertextual Web Search Engine (1998)
- L.Page, S.Brin, R.Motwani, T.Winograd: The PageRank Citation Ranking: Bringing Order to the Web (1998)

# This presentation is about: Google web search engine

- Not about:
  - Google Corporation
  - -Gmail, Google Maps, Google Docs, etc.
  - NASDAQ:GOOG
  - "Do no evil", etc. (maybe just a few words)

#### Web search

• WWW:

~30 B pages (source:Netcraft)

- Search engines:
  - crawl
  - index
  - -query (by keywords)
  - rank



#### Web search in 1998

- Not very useful:
  - mostly junk results
  - ranking doesn't work well
  - ex.: 3 of the 4 leading search engines can't find themselves
  - ex.: "Bill Clinton" joke of the day

### Web search in 1998

- Design elements:
  - term counting
  - backlink counting
  - meta tags
  - "mixed motives"
  - closed algorithms

### How was Google different?

- PageRank
- Using external information
- Scalable Architecture
- Openness, "Scientific Integrity"
- AdSense

- "Importance" of a page:
  is it possible to measure objectively?
- "Academic citations" model
- But the web is different:
  - heterogeneous
  - no quality control
  - ease of publishing
  - manipulation

- Basic idea:
  - links are not equally important
  - -Assign a Ranking for each page
  - Ranking propagates through links (votes)
  - "votes" evenly distributed among outgoing links



Simplified Ranking

$$R(u) = c \cdot \sum_{v \in B_u} \frac{R(v)}{|F_v|}$$

- u web page
- Fu forward link pages
- Bu backward link pages

- "Random Surfer" Model:
  - PageRank as probability distribution
- Problem with previous formula:
  - source sinks
  - Solution: damping factor (random surfer gets bored)
  - Pagerank with damping (typically d=0.85):

$$PR(u) = \frac{1-d}{N} + d \cdot \sum_{v \in B_u} \frac{PR(v)}{|F_v|}$$

- Computing PageRank: Iterative approach
- Convergence:
  - Affected by graph structure (good "expansion factor")
  - Initial values don't affect result, just convergence speed

-Typically ~log(N) nr. of iterations.

- Variants: personalized PageRank
- Manipulation

#### Meta-data

- Ranking of search results:
  - PageRank
  - Relevance to query
- Anchor text
  - Often describes a page better than the content itself
  - Can be abused through coordinated effort
- Other information:
  - Visual details
  - Page update frequency
  - Search term proximity

# Google Architecture

- Overview
- Data Structures
- Crawling
- Indexing
- Searching

#### Google Architecture



#### Data Structures

- BigFiles
- Repository
- Document Index
- Lexicon
- Hit Lists
- Forward Index
- Inverted Index

- Crawling
- Indexing:
  - Parsing
  - Indexing into Barrels
  - Sorting

# Searching

- 1. Parse query
- 2. Convert words into wordID
- 3. Seek start of doclist for every word
- 4. Scan through doclist until there is document matching all terms
- 5. Compute rank of document for query
- 6. If we are not at the end of any doclist and we haven't reached max. nr. of documents, go to 4
- 7. Sort matched documents by rank, return top k.

### Conclusions

- Original papers present Google as research project
- Commercial success largely due to technical superiority
- Influence:
  - On everyday life
  - On businesses
- AdSense, AdWords:
  - Made Google viable commercially
  - Changed the web by providing an easy way to monetize content
- Google:
  - Monitor the web, grow with it
  - Influence the web (SEO industry)

#### "Do no evil"

- Privacy
- Filtering results
  - -Google bombs
  - Link farms
  - Illegal stuff
  - Political issues
- Transparency (search data)
- Transparency (algorithms)

#### Thanks for the attention.