## Web Search

#### Introduction

## Outline

- History of www and some big players
- What are the challenges?
- Crawlers
- Ranking on the web (not just content)

## The World Wide Web

- Developed by Tim Berners-Lee in 1990 at CERN to organize research documents available on the Internet.
- Combined idea of documents available by FTP (File Transfer Protocol, to tranfer files between computers) with the idea of *hypertext* to link documents.
- Developed initial HTTP network protocol, URLs, HTML, and first "web server."

## Web Pre-History

- Ted Nelson developed idea of hypertext in 1965.
- Doug Engelbart invented the mouse and built the first implementation of hypertext in the late 1960's at SRI.
- ARPANET was developed in the early 1970's.
- The basic technology was in place in the 1970's; but it took the PC revolution and widespread networking to inspire the web and make it practical.

## Web Browser History

- Early browsers were developed in 1992 (Erwise, ViolaWWW).
- In 1993, Marc Andreessen and Eric Bina at UIUC NCSA (University of Illinois) developed the Mosaic browser and distributed it widely.
- Andreessen joined with James Clark (Stanford Prof. and Silicon Graphics founder) to form Mosaic Communications Inc. in 1994 (which became Netscape to avoid conflict with UIUC).
- Microsoft licensed the original Mosaic from UIUC and used it to build Internet Explorer in 1995.

## Search Engine Early History

- By late 1980's many files were available by anonymous FTP.
- In 1990, Alan Emtage of McGill Univ. developed Archie (short for "archives")
  - Assembled lists of files available on many FTP servers.
  - Allowed regex (regular expression) search of these file names.
- In 1993, *Veronica* and *Jughead* were developed to search names of text files available through Gopher (network protocol) servers.

## Web Search History

- In 1993, early web robots (spiders) were built to collect URL's:
  - Wanderer
  - ALIWEB (Archie-Like Index of the WEB)
  - WWW Worm (indexed URL's and titles for regex search)
- In 1994, Stanford grad students David Filo and Jerry Yang started manually collecting popular web sites into a topical hierarchy called Yahoo!.

## Web Search History

- In early 1994, Brian Pinkerton developed WebCrawler as a class project at U Washington. (eventually became part of Excite and AOL).
- A few months later, Fuzzy Maudlin, a grad student at CMU developed Lycos. First to use a standard IR system as developed for the DARPA Tipster project. First to index a large set of pages.
- In late 1995, DEC developed Altavista. Used a large farm of Alpha machines to quickly process large numbers of queries. Supported boolean operators, phrases, and "reverse pointer" queries.

## Web Search Recent History

In 1998, Larry Page and Sergey Brin, Ph.D. students at Stanford, started Google. Main advance is use of *link analysis* to rank results partially based on authority of a web page (roughly for now: the number of incoming hyperlinks).



## Search Engine Wars

- The battle for domination of the web search space is heating up!
- Crucial: advertising is combined with search results!
- What if one of the search engines will manage to dominate the space?

## Started off as a web directory service in 1994, acquired leading search engine

#### technology in 2003.

### Has very strong advertising and ecommerce partners



#### One of the pioneers of the field

- YCOS! Introduced innovations that inspired the creation of Google
  - Currently main business are media services (phone, video etc)



 Verb "google" has become synonymous with searching for information on the web.

- Has raised the bar on search quality
- Has been the most popular search engine in the last few years.
- Is the most innovative and dynamic.

G Find: Q

Google



Previous O Highlight all Match case

### BING (was: MSN Search, Live Search)

- Bing is the second largest search engine (about 20% in US)
- Owned by Microsoft
- Main features media and imaging





## Specialises in natural language question

#### answering.



## Web Challenges for IR

- Distributed Data: Documents spread over millions of different web servers.
- Volatile Data: Many documents change or disappear rapidly (e.g. dead links).
- Large Volume: Billions of separate documents.
- Unstructured and Redundant Data: No uniform structure, HTML errors, up to 30% (near) duplicate documents.
- Quality of Data: No editorial control, false information, poor quality writing, typos, etc.
- Heterogeneous Data: Multiple media types (images, video, VRML), languages, character sets, etc.

## **BIG, HOW MUCH BIG?**

## Indexed pages (Google, 2018)



## Bing, last 3 months



#### User population of selected internet browsers worldwide from 2012 to 2017 (in millions)\*



Sources StatCounter; Statista; ITU © Statista 2017 Additional Information: Worldwide; StatCounter; Statista; ITU; 2012 to 2017

# Market shares per web servers (to store, process and deliver web pages)

Apache	53.1%	
Nginx	29.5%	
Microsoft-IIS	11.9%	
LiteSpeed	2.3%	
Google Servers	1.4%	
Tomcat	0.5%	
IdeaWebServer	0.3%	
Apache Traffic Server	0.2%	
Node.js	0.2%	
Tengine	0.1%	
Cowboy	0.1%	
Lighttpd	0.1%	
IBM Servers	0.1%	
Oracle Servers	0.1%	
	W3Techs.com, 18 April 2016	
Percentages of websites using various web servers Note: a website may use more than one web server		

## Zipf's Law dominates on the Web

- Number of in-links/out-links to/from a page has a Zipfian distribution (frequency of pages with outdegree k as a % of the full population N).
- Length of web pages has a Zipfian distribution (frequency of pages with length k as a % of the full population N).
- Number of hits to a web page has a Zipfian distribution (pages accessed k times as a % of the full population N).

Zipf's law predicts that out of a population of N elements, the frequency of elements of "rank" k, f(k;s,N), is:

$$f(k; s, N) = \frac{1/k^s}{\sum_{n=1}^{N} (1/n^s)}.$$

- –N be the number of elements;
- -k be their rank;
- -s be the value of the exponent characterizing the distribution



# Example: Zipfian distribution of web pages in-degree



Very many pages with very low in-degree, very few pages with very high indegree

## Graph Structure in the Web



http://www9.org/w9cdrom/160/160.html



# THE WEB IS MOSTLY FREE ACCESS – HOW DO THE BIG PLAYERS MAKE MONEY?

## **Business Models for Web Search**

- Advertisers pay for banner ads on the site that **do not depend on a user's query**.
  - CPM: Cost Per Mille. Pay for each ad display.
    - (CPM=(cost of ad) / (#of readers/1000))
  - CPC: Cost Per Click. Pay only when user clicks on ad.
  - CTR: Click Through Rate. CTR=Number of clicks/ number of impressions\*
  - CPA: Cost Per Action (Acquisition). Pay only when user actually makes a purchase on target site.
- Advertisers bid for "keywords". Ads for highest bidders displayed when user query contains a purchased keyword.
  - PPC: Pay Per Click. CPC for bid word ads (e.g. Google AdWords).

\* Impressions: The number of times pages from "your site" appeared in search results,

## Affiliates Programs

- If you have a website, you can generate income by becoming an *affiliate* by agreeing to post ads relevant to the topic of your site.
- If users click on your impression of an ad, you get some percentage of the CPC or PPC income that is generated.
- Google introduces AdSense affiliates program in 2003.

# **CRAWLING, RANKING ON THE WWW**

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Google	Web Images Groups News Froogle more > spears	Search Advanced Search Preferences		
Web	Res	Its 1 - 10 of about 9,440,000 for spears [definition]. (0.14 seconds)		
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Ine data below shows some of the for the query [ britney spears ], an www.google.com/jobs/britney.html - Britney Spears pictures mp3 sites Britney Spears Forum Come see w www.britney-spears.com/ - 42k - Ju Britney Spears Zone - Your C Britney Spears, Britney Spears, B www.britneyzone.com/ - 101k - Jur	misspeiings detected by our spelling correction system id the count of how many different - 40k - Cached - Similar pages <u>a music Britney Spears lyrics</u> gallery photos images music fun games chat lyrics hat is inside the Britney Spears forum! un 14, 2004 - <u>Cached</u> - <u>Similar pages</u> <u>Suide to Britney Pictures and News</u> ritney Spears, Britney Spears, 1 14, 2004 - <u>Cached</u> - <u>Similar pages</u>	A V		

# Crawlers

A **Web crawler** is a software application which systematically browses the Web, for the purpose of Web indexing.

## Web Crawler: steps

- Starts with a set of *seeds*, which are a set of URLs given to it as parameters
- Seeds are added to a URL request queue
- Crawler starts fetching pages from the request queue
- Downloaded pages are parsed to find link tags that might contain other useful URLs to fetch
- New URLs added to the crawler's request queue, or *frontier*
- Continue until no more new URLs or disk full



## Many names

- Crawler
- Spider
- Robot (or bot)
- Web agent
- Wanderer, worm, ...
- And famous "instances": googlebot, scooter, slurp, msnbot, ...

#### Crawlers vs Browsers vs Scrapers

- Crawlers automatically harvest all files on the web
- Browsers are manual crawlers (user search through keywords or URL names)
- Scrapers takes pages that have been downloaded, and automatically extract data from it for manipulation



## Types of crawlers



- Universal: support universal web search engines
- Preferential: Selective bias toward some pages, eg. most "relevant"/topical, closest to seeds, most popular/largest, PageRank, highest rate/amount of change, etc..
# Focused Crawling

- Attempts to download only those pages that are about a particular topic
  - used by *vertical search* applications
  - E.g. Tripadvisor, PubMed, SkyScraper..
- Rely on the fact that pages about a topic tend to have links to other pages on the same topic
  - popular pages for a topic are typically used as seeds
- Crawler uses *text classifier* to decide whether a page is "on topic" before indexing it



# **Basic crawlers**

- This is a sequential universal crawler
- Seeds can be any list of starting URLs
- Order of page visits is determined by frontier data structure
- Stop criterion can be anything

# URL frontier

- Frontier: The next nodes to crawl
- Crawler start from a set of seed pages (initial fronteer) and then gradually expand



### Basic crawler



# **ISSUES** with crawling

- 1. Web Graph visiting policies
- 2. Efficiency (multithreads and distributed crawling)
- 3. Ethics (accessing and scraping web pages)
- 4. Freshness of information
- 5. Coverage of the web
- 6. Other issues

# 1. Web Graph visiting policies

- Breadth First Search
  - Implemented with QUEUE (FIFO)
  - Finds pages along shortest paths
  - Important to start with "good" pages, this keeps us close: maybe we get other good stuff...
- Depth First Search
  - Implemented with STACK (LIFO)
  - Wander away ("lost in cyberspace")



# 2. Efficiency (1)

- Web crawlers spend a lot of time waiting for responses to requests
- To reduce this inefficiency, web crawlers use **threads** (executions that are independent and can run in parallel) and fetch hundreds of pages at once

# Efficiency (2)

**procedure** CRAWLERTHREAD(frontier) while not frontier.done() do website  $\leftarrow$  frontier.nextSite()  $url \leftarrow website.nextURL()$ if website.permitsCrawl(url) then  $text \leftarrow retrieveURL(url)$ storeDocument(url, text) for each url in parse(text) do frontier.addURL(url) end for end if frontier.releaseSite(website) end while end procedure

Simple Crawler Thread

# Efficiency (3)

- Multithreading improves efficiency, **distributed crawling** (multiple computers) is the other method
- Three reasons to use multiple computers for crawling
  - Helps to put the crawler closer to the sites it crawls
  - Reduces the number of sites the crawler has to remember
  - Reduces computing resources required
- Distributed crawler uses a hash function to assign URLs to crawling computers

# 3. Crawler ethics (1)

- Crawlers can cause trouble, even unwillingly, if not properly designed to be "polite" and "ethical"
- For example, sending too many requests in rapid succession to a single server can amount to a Denial of Service (DoS) attack!
  - Server administrator and users will be upset
  - Crawler developer/admin IP address may be blacklisted

# Crawler ethics (2)

- Even crawling a site slowly will anger some web server administrators, who object to any copying of their data
- **Robots**.txt file can be used to control crawlers

```
User-agent: *
Disallow: /private/
Disallow: /confidential/
Disallow: /other/
Allow: /other/public/
```

User-agent: FavoredCrawler Disallow:

Sitemap: http://mysite.com/sitemap.xml.gz

# 4. Freshness/Age

- Web pages are constantly being added, deleted, and modified
- Web crawler must continually **revisit pages** it has already crawled to see if they have changed in order to maintain the *freshness* of the document collection
  - *stale* copies no longer reflect the real contents of the web pages

# Freshness/Age (2)

- HTTP protocol has a special request type called HEAD that makes it easy to check for page changes
  - HEAD method returns (meta)information about page, not page itself

Client request: HEAD /csinfo/people.html HTTP/1.1 Host: www.cs.umass.edu HTTP/1.1 200 OK Date: Thu, 03 Apr 2008 05:17:54 GMT Server: Apache/2.0.52 (CentOS) Last-Modified: Fri, 04 Jan 2008 15:28:39 GMT Server response: ETag: "239c33-2576-2a2837c0" Accept-Ranges: bytes Content-Length: 9590 Connection: close Content-Type: text/html; charset=ISO-8859-1

# Freshness/Age (3)

- Not possible to constantly check all pages
  - must check important pages and pages that change frequently
- Freshness is the proportion of pages that are fresh
- Optimizing for this metric can lead to bad decisions, such as not crawling popular sites who do not change frequently
- *Age* is a better metric

# Freshness/Age (4)

• Expected **age** of a page t days after it was last crawled:

Age $(\lambda, t) = \int_0^t P(\text{page changed at time } x)(t - x)dx$ • Web page updates follow the Poisson

- distribution on average
  - time until the next update is governed by an exponential (Poisson) distribution :

Age
$$(\lambda, t) = \int_0^t \lambda e^{-\lambda x} (t - x) dx$$

 $\lambda$  is change rate (site-dependent)

# Freshness/Age (5)

- The older a page gets, the more it costs not to crawl it
  - e.g., expected age with mean change frequency  $\lambda = 1/7$  (one change per week)



# Freshness/Age (6)

- Sitemaps contain lists of URLs and data about those URLs, such as modification time and modification frequency (to estimate age)
- Generated by web server administrators
- Gives crawler a hint about when to check a page for changes

# Freshness/Age (7)

### Sitemap Example

```
<?xml version="1.0" encoding="UTF-8"?>
<urlset xmlns="http://www.sitemaps.org/schemas/sitemap/0.9">
  <url>
    <loc>http://www.company.com/</loc>
    <lastmod>2008-01-15</lastmod>
    <changefreq>monthly</changefreq>
    <priority>0.7</priority>
  </url>
  \langle url \rangle
    <loc>http://www.company.com/items?item=truck</loc>
    <changefreq>weekly</changefreq>
  </url>
  \langle url \rangle
    <loc>http://www.company.com/items?item=bicycle</loc>
    <changefreq>daily</changefreq>
  </url>
</urlset>
```

# 5. Coverage (1)

- Do we need to crawl the entire Web?
- If we cover too much, it will get stale
- There is an abundance of pages in the Web, but some are useless
- What is the goal?
  - General search engines: pages with high prestige
  - News portals: pages that change often
  - Vertical portals: pages on some topic

# Coverage (2)



Web coverage by search engine crawlers

# Deep Web





- The web that the vast majority of internet users are accustomed to.
- Accessible in any nation that does not block internet access, even places like China and Egypt.
- Social media sites like Facebook, informational websites like Wikipedia, general websites, etc.



- The layer of the Surface Web that is **blocked** in some nations. Some other information is only accessible through illegal means.
- Google locked results
- Recently web crawled old content
- Pirated Media
- Pornography

- Requires a proxy or two (namely Tor free sw for anonymous browsing) to access.
- Contains most of the archived web pages of the 1990s Web that **did not renew** their domain names and such.
- Government/Business/Collegiate Research.
- Hackers/Script Kiddies/Virus Information.
- Illegal and Obscene Content (CP, Gore, Suicides, etc.)

-Level 4- The Charter Web

- Like the Regular Deep Web, but harder to get into and **more illegal content**.
- Advanced covert government research.
- Most of the internet black market (run on bitcoins)
- Human/Arms/Drug/Rare Animal Trafficking.
- Assassination networks , bounty hunters, illegal game hunting, and other bad stuff



- Lowest known level of the Deep Web.
- Named after the Spanish Technician who created it.
- Extremely difficult to access, users say it is the safest part of the internet due to how private it is.
- Julian Assange and other top-level Wikileaks members are believed to have access.





- Mostly the stuff of conspiracy theorists.
- Level 6 is a giant firewall meant to prevent people from going any further.
- Level 7 "The Fog" is where various worldwide power-players jockey for control of PrimArch. Said to be very dangerous, full of viruses and such.
- Level 8 is called PrimArch and is claimed to be controlled by an extremely powerful AI (possibly running on a quantum computer).

# Other crawler implementation issues

- Duplication: Don't want to fetch same page twice!
  - Keep lookup table (hash) of visited pages
  - What if not visited but in frontier already?
- Prioritized search: The frontier grows very fast!
  - For large crawls, need to define an exploration policy **with priorities**, rather than depth first or breadth first
- Availability: Fetcher must be robust!
  - Don't crash if download fails
  - Timeout mechanism
- Skip policy: Determine file type to skip unwanted files
  - Can try using extensions, but not reliable
  - Can issue 'HEAD' HTTP commands to get Content-Type (MIME) headers, but overhead of extra Internet requests



# About Google's regular crawling of the web

Google's spiders regularly crawl the web to rebuild our index. Crawls are based on many factors such as PageRank, links to a page, and crawling constraints such as the number of parameters in a URL. Any number of factors can affect the crawl frequency of individual sites.

Our crawl process is algorithmic; computer programs determine which sites to crawl, how often, and how many pages to fetch from each site. We don't accept payment to crawl a site more frequently. For tips on maintaining a crawler-friendly website, please visit our Webmaster Guidelines.

Web page ranking: Manual/automatic classification Link analysis

# Why we need to classify pages?

- Vector Space ranking is not enough
- Queries on the web return millions hits based only on content similarity (Vector Space or other ranking methods)
- Need **additional criteria** for selecting good pages:
  - Classification of web pages into pre-defined categories
  - Assigning relevance to pages depending upon their "position" in the web graph (link analysis)

# Manual Hierarchical Web Taxonomies

• Yahoo (old) approach of using human editors to assemble a large hierarchically structured directory of web pages.

– <u>http://www.yahoo.com/</u>

- Open Directory Project is a similar approach based on the distributed labor of volunteer editors ("net-citizens provide the collective brain"). Used by most other search engines. Started by Netscape.
  - <u>http://www.dmoz.org/</u>
  - Now replaced by https://dmoztools.net/

### Welcome!

#### This site includes information formerly made available via DMOZ.

Visit resource-zone to stay in touch with the community.



Arts Movies, Television, Music...



 $\approx$ 

Games Video Games, RPGs, Gambling...

Media, Newspapers, Weather...

US, Canada, UK, Europe...

People, Religion, Issues...







**i** 

**Business** 

Health

Recreation Travel, Food, Outdoors, Humor...

Fitness, Medicine, Alternative...

Jobs, Real Estate, Investing...

Science Biology, Psychology, Physics...





Computers Internet, Software, Hardware...



Home Family, Consumers, Cooking...



Reference Maps, Education, Libraries...



Shopping Clothing, Food, Gifts...

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**Kids & Teens Directory** Arts, School Time, Teen Life...



#### World

News

Regional

Society

Deutsch, Français, 日本語, Italiano, Español, Русский, Nederlands, Polski, Türkçe, Dansk, 简体中文, ...

91,929	1,031,722	3,861,210	90
Editors	Categories	Sites	Languages
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#Orga





🔻 Related categories 6 📂



Last update: March 2, 2017 at 18:45:56 UTC



### ▼ Sites 2 📄

### 🖹 Go Fish

Rules and links for the game and variations.

### 🖹 Go Fish

Rules, information and links.

Last update: 🗰 January 2, 2007 at 21:41:35 UTC

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DE EN Choose your lan

### Go Fish, Authors, Happy Families, Quartet

- Introduction
- Go Fish
- Variations
- Australian Fish
- Omben / Minuman (Indonesia)
- Authors
- Happy Families
- Pâi Hông (Thailand)
- Quartett
- Other Web Pages and Software

### Introduction



Buy Authors C from amazon.

The object is to collect **books**, which are sets of four cards of the same rank, by asking other players for cards you think they may have. Whoever collects most sets wins. The basic idea is very simple and they are often thou of as children's games.

So far as I know, games of this type first appeared in the mid 19th century and were played with special cards. In Britain there was **Spade the Gardener**, in which players collect families of five cards, later superseded by Harmilies, in which each family consists of four cards (mother, father, son, daughter). In the USA, the game of **Dr Busby**, also based on families, was first published in 1843, followed by **Authors** in 1861. I do not know whether these games were based on an earlier game played with standard cards, or whether the adaptation to use a standard pack came later.

### Go Fish

This game is often just known as Fish, but the name "Fish" (or Canadian Fish or Russian Fish) is also sometimes used for the more complex partnership game Literature. Go Fish is best for 3-6 players, but it is possible for 2 to
# Web page classification

- Except for DMOZ, page categorization is "openly" used only by *focused search engines* (eg Ebay, Amazon..)
- The general problem of webpage classification can be divided into
  - Subject classification; subject or topic of webpage e.g. "Adult", "Sport", "Business".
  - Function classification; the role that the webpage play e.g. "Personal homepage", "Course page", "Commercial page".

## Types of classification



### -Hard vrs. Soft (multi-class) classification

Web Page Classification

### • <u>Constructing and expanding web directories</u> (web hierarchies)

– How are they doing?

## Keyworder



- By human effort
  - July 2006, it was reported there are 73,354 editor in the dmoz ODP.

# Automatic Document Classification

- Manual classification into a given hierarchy is labor intensive, subjective, and error-prone.
- Text categorization methods provide a way to automatically classify documents.
- Best methods based on training a *machine learning* (*pattern recognition*) system on a labeled set of examples (*supervised learning*).

# Hierarchical Agglomerative Clustering



Strategies for hierarchical clustering generally fall into two types:

- Agglomerative: This is a "bottom up" approach: each observation starts in its own cluster, and pairs of clusters are merged as one moves up the hierarchy.

- **Divisive**: This is a "top down" approach: all observations start in one cluster, and splits are performed recursively as one moves down the hierarchy.

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## Hierarchical Agglomerative Clustering (HAC) Algorithm

- Start with all instances (web pages) in their own (singleton) cluster.
- Until there is only one cluster:
  - Among the current clusters, determine the two clusters,  $c_i$  and  $c_i$ , that are most similar.
  - Replace  $c_i$  and  $c_j$  with a single cluster  $c_i \cup c_j$

"instance" is a web page, represented by a vector (see later)

Dendrogram: Document Example

• As clusters *agglomerate*, web pages are likely to fall into a hierarchy of "topics" or concepts.



# Feature selection in HAC

- Problem: how do we describe a page?
- Bag-of-words vector not appropriate in this case (page may include off-topic information)
- Lower number of more descriptive features, based on two criteria:
  - <u>On-page</u> (selected features in the page)
  - <u>Neibourgh features</u> (selected features in the pages "pointing" at that page)

# Features: On-page

### • Textual content and tags

- N-gram feature (n-gram= sequence of n consecutive words)
  - Also called n-words, e.g. "New York" is a biword.
  - In Yahoo!, they used **5-grams** features.
- HTML tags or DOM (document object model)
  - Title, Headings, Metadata and Main text
    - Assigned each of them an arbitrary weight.
    - Now a day most of websites bare using Nested list () which really help in web page classification (Metatag, anchor tag).

# Features: On-page

### • Visual analysis

- Each webpage has two representations
  - 1. Text represented in HTML
  - 2. The visual representation rendered by a web browser
- visual information is useful as well
  - Each webpage is represented as a hierarchical "Visual adjacency multi graph."
  - In the graph each node represents an HTML object and each edge represents the spatial relation in the visual representation.
  - Challenge: web pages have templates and only a fragment of the content is relevant to the topic of the web page

## Visual graph representation



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### Visual analysis

(?) Click on question much to load a new file.



State of the Union Address, 2007



world. And so long as that's the case, America is still a nation at was

a extremizer who are just as hortile to America and are also determined to dominate th

he great quartion of our day is whether America will help men and women in the Minkle E. s. Many in this chamber understand that America react not field in Iraq, because you unde

Layout graph



Content graph

work

take

world

war

### Motivation

 Often in-page features are missing or unrecognizable

### Example webpage which has few useful on-page features



### Underlying Assumptions

- When exploring the features of neighbors, some assumptions are implicitly made (like e.g. homophyly: pages point at similar ones).
- The presence of many "sports" pages in the neighborhood of *Page-a* increases the probability of *Page-a* being in "Sport".
- linked pages are more likely to have terms in common .

### Neighbor selection

- Existing research mainly focuses on page within two steps of the page to be classified. (At the distance no greater than two).
- There are six types of neighboring pages: parent, child, sibling, spouse, grandparent and grandchild.

### Neighbors with in radius of two



### • Neighbor selection cont.

- The text on the parent pages **surrounding the link** is used to train a classifier instead of text on the target page.
- Using page title and **anchor text from parent pages** can improve classification compared a pure text classifier.

### • <u>Neighbor selection cont.</u>

- Summary
  - Using parent, child, sibling and spouse pages are all useful in classification, **siblings are found to be the best source.**
  - Using information from neighboring pages may introduce extra noise, should be used carefully.

- Utilizing artificial links (implicit links)
  - The hyperlinks are not the only one choice to find neighbors.
- What is implicit link?
  - Connections between pages that appear in the results of the same query and are both clicked by users.
- **Implicit link** can help webpage classification as well as hyperlinks.

#### How To Access Notorious Dark Web Anonymously (10 Step Guide ) https://darkwebnews.com/help-advice/access-dark-web/ -

We cover everything, from setting up Tor, how to choose a VPN, what not to do, finding the best sites to access, and extra steps to remain anonymous. ... If you are looking to access hidden marketplace's or darknet websites (with a .onion domain) then **dark web** access is done using ... Dark Web Beginners Security ... · Deep Web · Deep Web Links · Darknet Market List

#### What is the Dark Web & How to Access it - Tech Advisor

#### https://www.techadvisor.co.uk > ... > What is the Dark Web & How to Access it T

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### What Is The Dark Web? | IFLScience

#### www.iflscience.com/technology/what-dark-web/ -

The "dark web" is a part of the world wide web that requires special software to access. Once inside, web sites and other services can be accessed through a browser in much the same way as the normal web. However, some sites are effectively "hidden", in that they have not been indexed by a search engine and can only ...

### Next..

• Ranking with Link Analysis (page Rank, HITS)