# CS6200 Information Retrieval

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Northeastern University



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Information retrieval - Wikipedia, the free encyclopedia

en.wikipedia.org/wiki/Information retrieval

**Information retrieval (IR)** is the area of study concerned with searching for documents, for information within documents, and for metadata about documents, ...

Category:Information retrieval - Relevance - SMART Information Retrieval System

Introduction to Information Retrieval

nlp.stanford.edu/IR-book/

25+ items - Introduction to Information Retrieval. This is the companion ...

Front matter (incl. table of notations) pdf

03 Dictionaries and tolerant retrieval

Slides - Information Retrieval Resources - Exercises - Boolean retrieval

Information Retrieval

www.springer.com/computer/...%26+information+retrieval/.../10791

The Journal of **Information Retrieval** is an international forum for theory, algorithms, and experiments that concern search and storage of text, images, video, and ...

cmpsci 646, fall 2010 | Information Retrieval

cs646.cs.umass.edu/

CMPSCI 646 is a graduate-level class in **information retrieval** offered at the University of Massachusetts Amherst. Announcements: Mon, Dec 13. Some ranked ...

Center for Intelligent Information Retrieval

ciir.cs.umass.edu/

University of Massachusetts research lab focused on efficient access to large, heterogeneous, distributed, text and multimedia databases.

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gofishin.com - Cached page

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- 2. James Tropical Fish Inc (413) 543-1994 1865 Page Blvd - Indian Orchard - Directions
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#### Fish Supplies: Fish Tank & Fish Care | DrsFosterSmith.com

Supplies to setup & maintain fresh or saltwater fish aquariums. Fish tanks, lighting, test kits, filters. food & more, \$5.99 FLAT RATE ground shipping.

www.drsfostersmith.com/fish-supplies/pr/c/3578 - Cached page

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tropical fish

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#### Tropical Fish

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#### Tropical Fish

Tropical Fish 1 through 10 of 78  $\neg \neg \uparrow$  > 1 2 3 ... 8 ... Currently, we have 3 fish and my olde r brother mostly take care of them...

zh.englishbaby.com/forum/ ... /139467 2012-8-31 - 百度快照

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tropical\_fish.download.csdn.net/ 2009-7-29 - 百度快照

#### Tropical Fish (film) - Wikipedia, the free encyclopedia

Tropical Fish (Chinese: 热带鱼; pinyin: Rèdài Yú; Pe h-ōe-jī: Jia t-tài H ) is a 1995 Taiwanese comedy-drama film written and ... en.wikipedia.org/ ... \_Fish\_(film) 2012-8-19 繁体 - 百度快照

#### Tropical Fish - Peter Stadelmann - Google 图书

Aquarium owners will find valuable information on maintaining correct water chemistry and te mperature, and creating an optimal environment for tropical fish ... books.google.com.hk/ ... Sh5&hl=zh-CN 2012-7-20 - 百度快照

#### tropical fish 百度词典

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dict.baidu.com/s?wd=tropical fish 2012-9-6

#### **AC Tropical Fish & Aquarium**

AC Tropical fish & aquarium features a large number of aquarium articles, species profiles an d other resources for all those who keep tropical fish in ... www.aquaticcommunity.com/ 2012-8-31 - 百度快照

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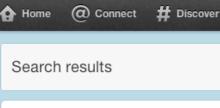
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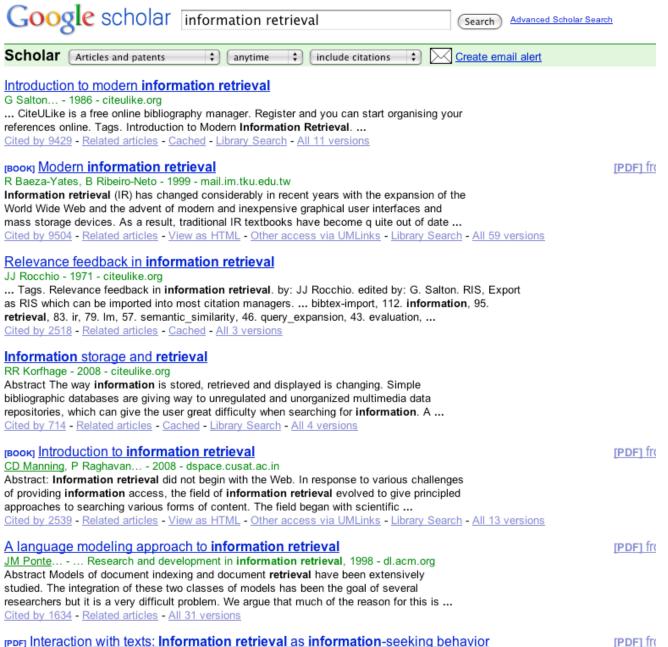
That-Fish-Place-That-Pet-Place: Discount Dog Supplies from the Largest Pet Store In the World: That Pet Place dlvr.it/16bnjp



#### eBC Pets Northeast @eBC Pets NE

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[PDF] Interaction with texts: Information retrieval as information-seeking behavior
NJ Belkin - Information retrieval. 1993 - Citeseer

Abstract We present an analysis of **information retrieval** as an **information**-seeking activity, supporting people's inteactions with text. This analysis suggests that some assumptions underlying the standard model of **information retrieval** are inappropriate, and we suggest ... Cited by 143 - Related articles - View as HTML - All 8 versions

## **Course Goals**

- To help you to understand search engines, evaluate and compare them, and modify them for specific applications
- Provide broad coverage of the important issues in information retrieval and search engines
- Books (Kindle editions OK):
  - Search Engines: Information Retrieval in Practice
    - Croft, Metzler, and Strohman
  - Introduction to Information Retrieval
    - Manning, Raghavan, and Schütze
  - Not required, but readings will be recommended

# **Topics**

- Overview
- Architecture of a search engine
- Data acquisition
- Text representation
- Information extraction
- Indexing
- Query processing
- Ranking
- Evaluation
- Classification and clustering
- Social search
- More...

## **Course Evaluation**

- Six assignments
  - Some require written answers and some short programming exercises.
  - Others involve more extensive programming and a short written report on your design choices and experimental results.
  - You may use any programming language installed on college Linux machines, so we can (compile and) run your code.
  - You may save work by using reasonable libraries that don't simply implement the goal of the assignment
    - E.g., HTTP request libraries are OK; web-crawling libraries are not.
  - No final exam; last assignment will be due December 9.

# Late Policy

- Assignments are due at the beginning of class on the announced due date.
- You may take one homework extension of four calendar days, to be used at your discretion, no questions asked.
- After the first late assignment, unexcused late assignments will be penalized 20% per calendar day late. We normally will not accept assignments after the date on which the following assignment is due or after the solutions have been handed out, whichever comes first.
- If you are in circumstances that would cause you to turn in an assignment late, please contact me in advance to obtain full credit.

# **Academic Honesty**

- All work submitted for credit must be your own.
- You may discuss the assignments with your classmates, the TA, and the instructor. You must acknowledge the people with whom you discussed your work, and you must write up your own solutions.
- Any written sources used (apart from the text)
  must also be acknowledged; however, you may
  not consult any solutions from previous years'
  assignments whether they are student or faculty
  generated.

## Contact

- Me
  - Office hours: TBA, Room 356
  - dasmith@ccs.neu.edu
- TAs
  - Jesse Anderton: WVH 472, TBA
    - jesse@ccs.neu.edu
  - Ting Chen: WVH 472, TBA
    - tingchen@ccs.neu.edu
- Course website and Piazza list
  - http://www.ccs.neu.edu/course/cs6200f14/

## Information Retrieval

- "Information retrieval is a field concerned with the structure, analysis, organization, storage, searching, and retrieval of information." (Salton, 1968)
  - General definition that can be applied to many types of information and search applications
  - Primary focus of IR since the 50s has been on text and documents

## What is a Document?

### Examples:

 web pages, email, books, news stories, scholarly papers, text messages, tweets, MS Office, PDF, Facebook pages, blogs, forum postings, IM sessions, etc.

### Common properties

- text content
- some structure (e.g., title, author, date for papers;
   subject, sender, destination for email)

## Documents vs. Database Records

- Database records (or tuples in relational databases) are typically made up of welldefined fields (or attributes)
  - e.g., bank records with account numbers,
     balances, names, addresses, social security
     numbers, dates of birth, etc.
- Easy to compare fields with well-defined semantics to queries in order to find matches
- Text is more difficult

## Documents vs. Records

- Example bank database query
  - Find records with balance > \$50,000 in branches
     located in Somerville, MA.
  - Matches easily found by comparison with field values of records
- Example search engine query
  - bank scandals in western mass
  - This text must be compared to the text of entire news stories

## **Comparing Text**

- Comparing the query text to the document text and determining what is a good match is the <u>core issue</u> of information retrieval
- Exact matching of words is not enough
  - Many different ways to write the same thing in a "natural language" like English
  - e.g., does a news story containing the text "bank director in Amherst steals funds" match the query?
  - Some stories will be better matches than others

## Dimensions of IR

- IR is more than just text, and more than just web search
  - although these are central
- People doing IR work with different media, different types of search applications, and different tasks

## Dimensions of IR

Content	<b>Applications</b>	Tasks
Text	Web search	Ad hoc search
Images	Vertical search	Filtering
Video	Enterprise search	Classification
Scanned docs	Desktop search	Question answering
Audio	Forum search	Summarization
Music	P2P search	
	Literature search	

### Relevance

- What is it?
- Simple (and simplistic) definition: A relevant document contains the information that a person was looking for when they submitted a query to the search engine
- Many factors influence users' decision about what is relevant: e.g., task, context, novelty, style, other documents they've already read
- Topical relevance (same topic) vs. user relevance (everything else)

### Relevance

- Retrieval models define a view of relevance
- Ranking algorithms used in search engines are based on retrieval models
- Most models based on statistical properties of text rather than deep linguistic analysis
  - i.e., counting simple text features such as words instead of parsing and analyzing the sentences

### Evaluation

- Experimental procedures and measures for comparing system output with user expectations
- IR evaluation methods now used in many fields
  - e.g. Netflix competition
- Typically use test collection of documents, queries, and relevance judgments
  - Most commonly used are TREC collections
- Recall and precision are two examples of effectiveness measures

- Users and Information Needs
  - Search evaluation is user-centered
  - Keyword queries are often poor descriptions of actual information needs
  - Interaction and context are important for understanding user intent
  - Query refinement techniques such as query expansion, query suggestion, relevance feedback improve ranking

# IR and Search Engines

- A search engine is the practical application of information retrieval techniques to large scale text collections
- Web search engines are best-known examples, but many others
  - Open source search engines are important for research and development
    - e.g., Lucene, Lemur/Indri, Galago
- Big issues include main IR issues but also some others

# IR and Search Engines

### Information Retrieval

### Relevance

-Effective ranking

### **Evaluation**

-Testing and measuring

### Information needs

-User interaction

### Performance

-Efficient search and indexing

Search Engines

### Incorporating new data

-Coverage and freshness

### Scalability

-Growing with data and users

### Adaptability

-Tuning for applications

### Specific problems

-e.g. Spam



### Performance

- Measuring and improving the efficiency of search
  - e.g., reducing response time, increasing query throughput, increasing indexing speed
- Indexes are data structures designed to improve search efficiency
  - designing and implementing them are major issues for search engines

- Dynamic data
  - The "collection" for most real applications is constantly changing in terms of updates, additions, deletions
    - e.g., web pages
  - Acquiring or "crawling" the documents is a major task
    - Typical measures are coverage (how much has been indexed) and freshness (how recently was it indexed)
  - Updating the indexes while processing queries is also a design issue

## Scalability

- Making everything work with millions of users every day, and many terabytes of documents
- Distributed processing is essential

## Adaptability

 Changing and tuning search engine components such as ranking algorithm, indexing strategy, interface for different applications

### Spam

- For web search, spam in all its forms is one of the major issues
- Affects the efficiency of search engines and, more seriously, the <u>effectiveness</u> of the results
- Proliferation of spam varieties
  - e.g. spamdexing or term spam, link spam, "search engine optimization"
- New subfield called adversarial IR, since spammers are "adversaries" with different goals

# **Topics**

- Overview
- Architecture of a search engine

 For background, read chapters 1 and 2 of Search Engines by Croft, Metzler, and Strohman