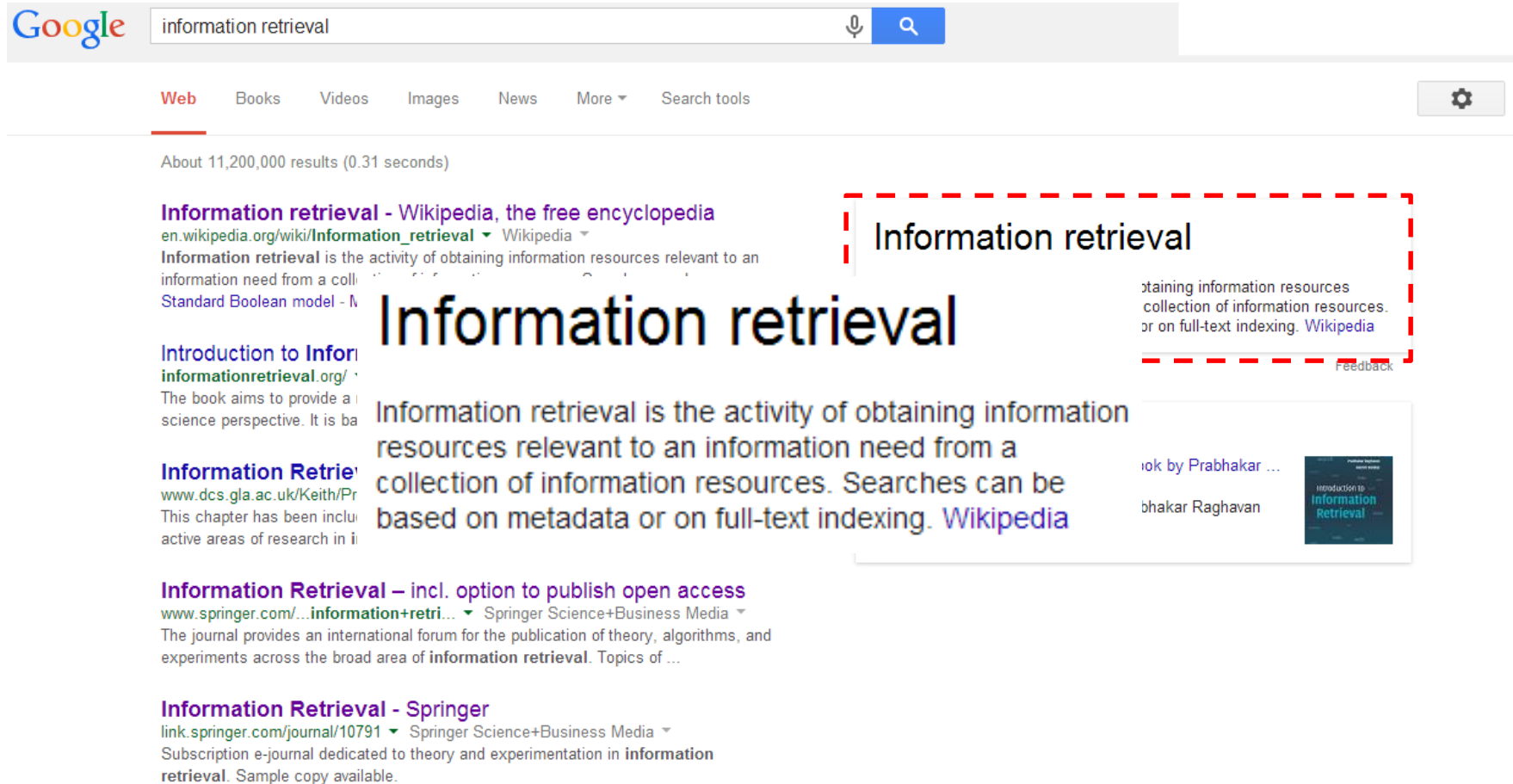


# Information Retrieval

## Lecture 1 Introduction

# What is information retrieval?



The image is a screenshot of a Google search results page for the query "information retrieval". The search bar at the top shows the query and a microphone icon. Below the search bar, the "Web" tab is selected, and the results are displayed. A red dashed box highlights a specific result, which is a definition of "Information retrieval" and a book cover titled "Introduction to Information Retrieval" by Prabhakar Raghavan. The definition states: "Information retrieval is the activity of obtaining information resources relevant to an information need from a collection of information resources. Searches can be based on metadata or on full-text indexing. Wikipedia". The book cover shows the title "Introduction to Information Retrieval" and the author "Prabhakar Raghavan".

Google

information retrieval

Web Books Videos Images News More Search tools

About 11,200,000 results (0.31 seconds)

**Information retrieval** - Wikipedia, the free encyclopedia  
en.wikipedia.org/wiki/Information\_retrieval - Wikipedia  
Information retrieval is the activity of obtaining information resources relevant to an information need from a collection of information resources. Searches can be based on metadata or on full-text indexing. Wikipedia

**Information retrieval**

obtaining information resources  
collection of information resources.  
or on full-text indexing. Wikipedia

Feedback

**Information Retrieval**  
www.dcs.gla.ac.uk/Keith/Pr...  
The book aims to provide a science perspective. It is based on metadata or on full-text indexing. Wikipedia

**Information Retrieval** – incl. option to publish open access  
www.springer.com/...information+retri... - Springer Science+Business Media  
The journal provides an international forum for the publication of theory, algorithms, and experiments across the broad area of information retrieval. Topics of ...

**Information Retrieval - Springer**  
link.springer.com/journal/10791 - Springer Science+Business Media  
Subscription e-journal dedicated to theory and experimentation in information retrieval. Sample copy available.

Book by Prabhakar ...  
Prabhakar Raghavan

Introduction to Information Retrieval

# Why information retrieval

- Information overload
  - “It refers to the difficulty a person can have understanding an issue and making decisions that can be caused by the presence of too much information.” - wiki



# Why information retrieval

- Information overload

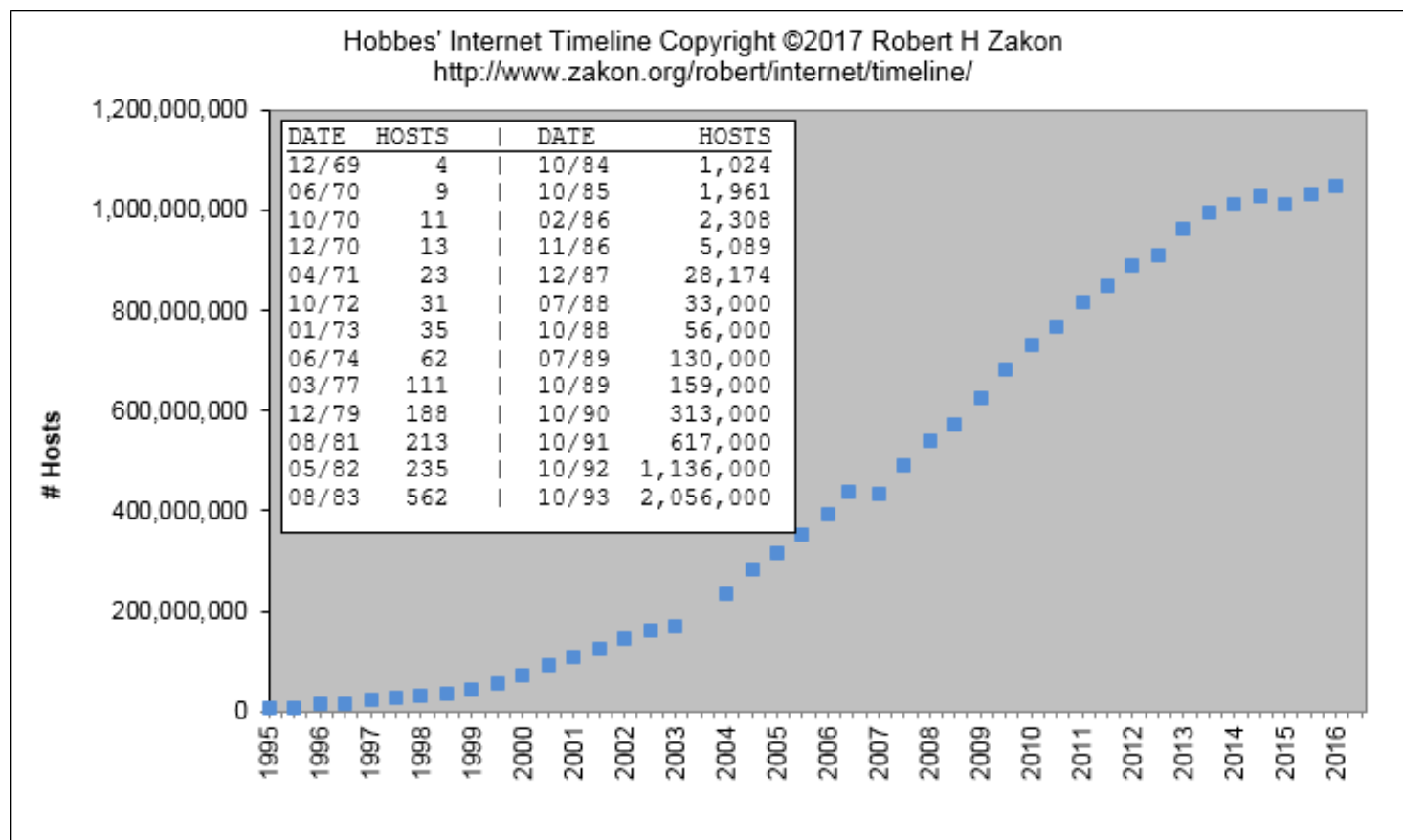


Figure 1: Growth of Internet

# Why information retrieval

- Information overload

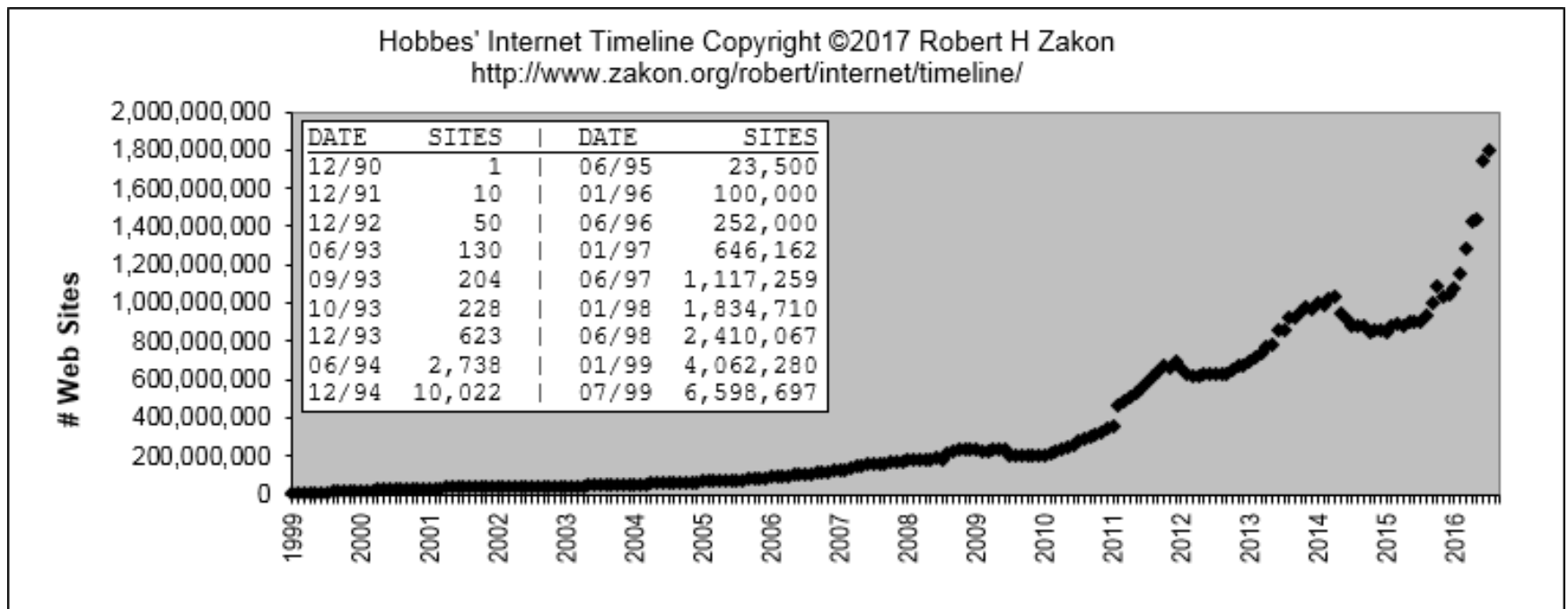


Figure 2: Growth of WWW

# Why information retrieval

- Handling unstructured data
  - Structured data: database system is a good choice

– Unstructured data

- Text

- “XML”

UI

- User

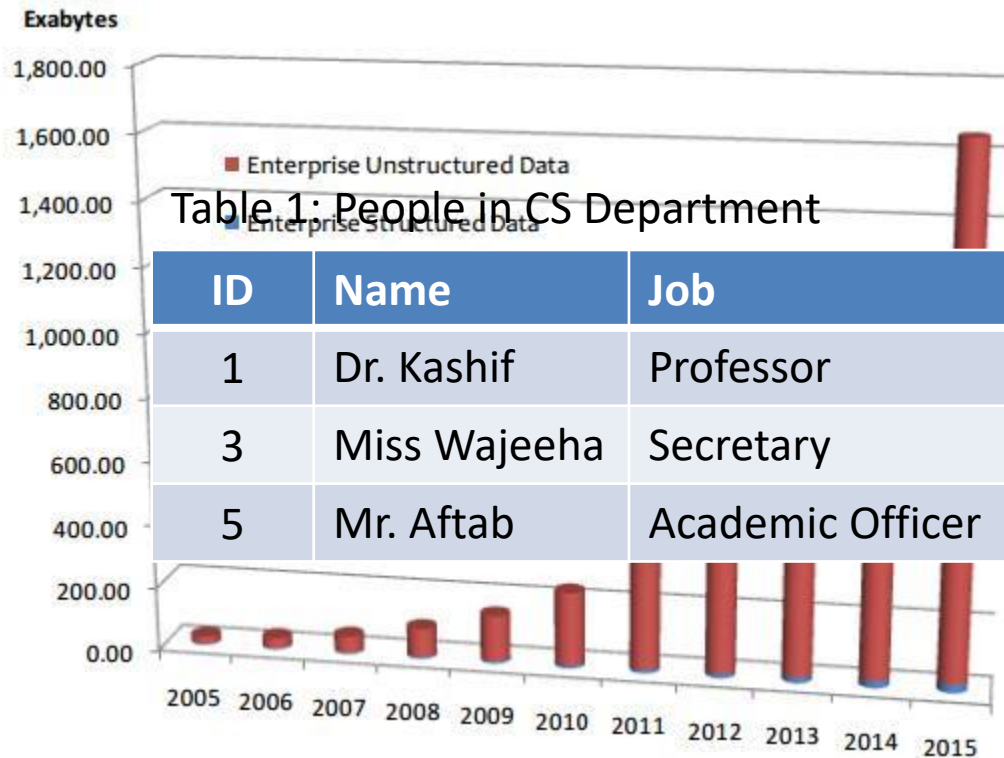


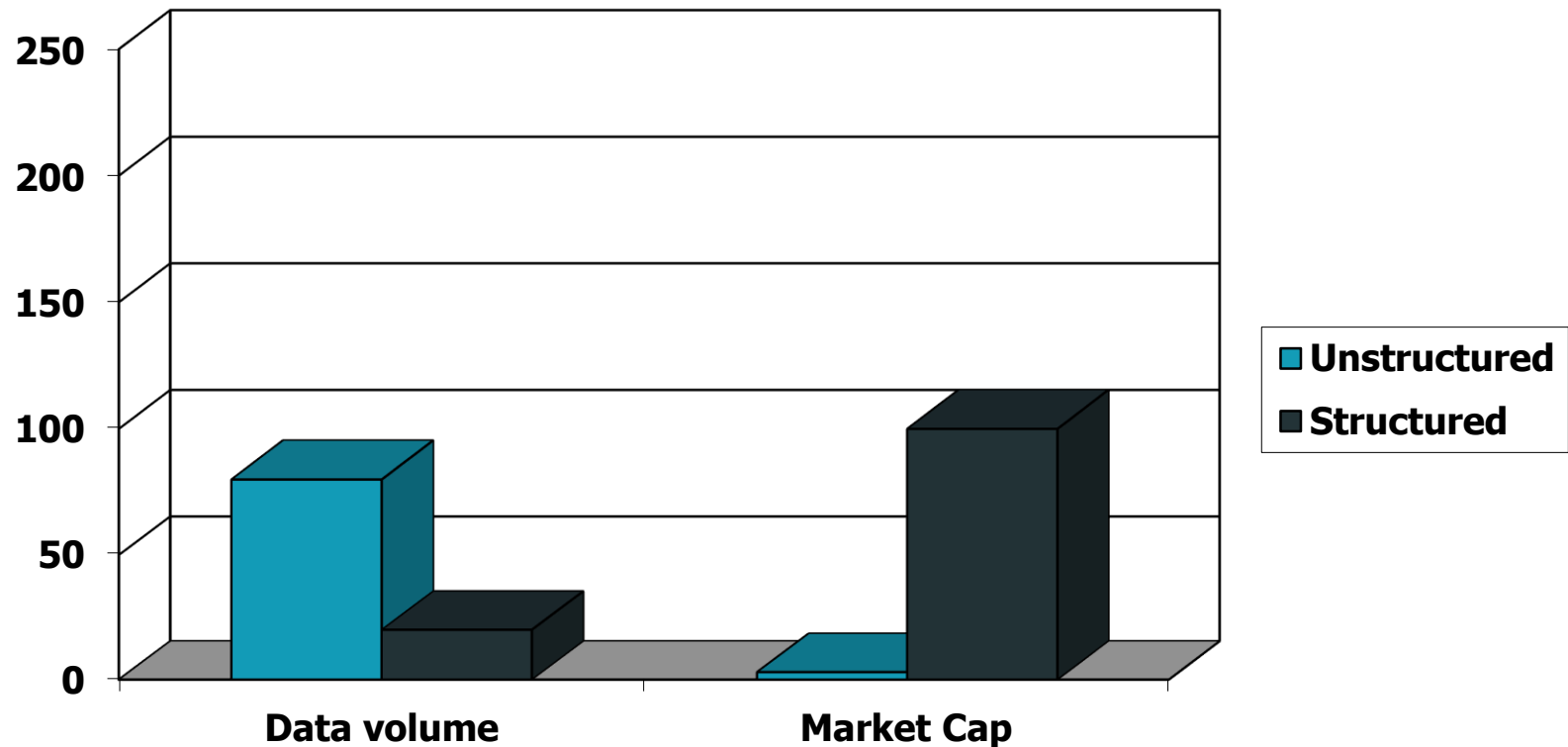
Table 1: People in CS Department

ID	Name	Job
1	Dr. Kashif	Professor
3	Miss Wajeeha	Secretary
5	Mr. Aftab	Academic Officer

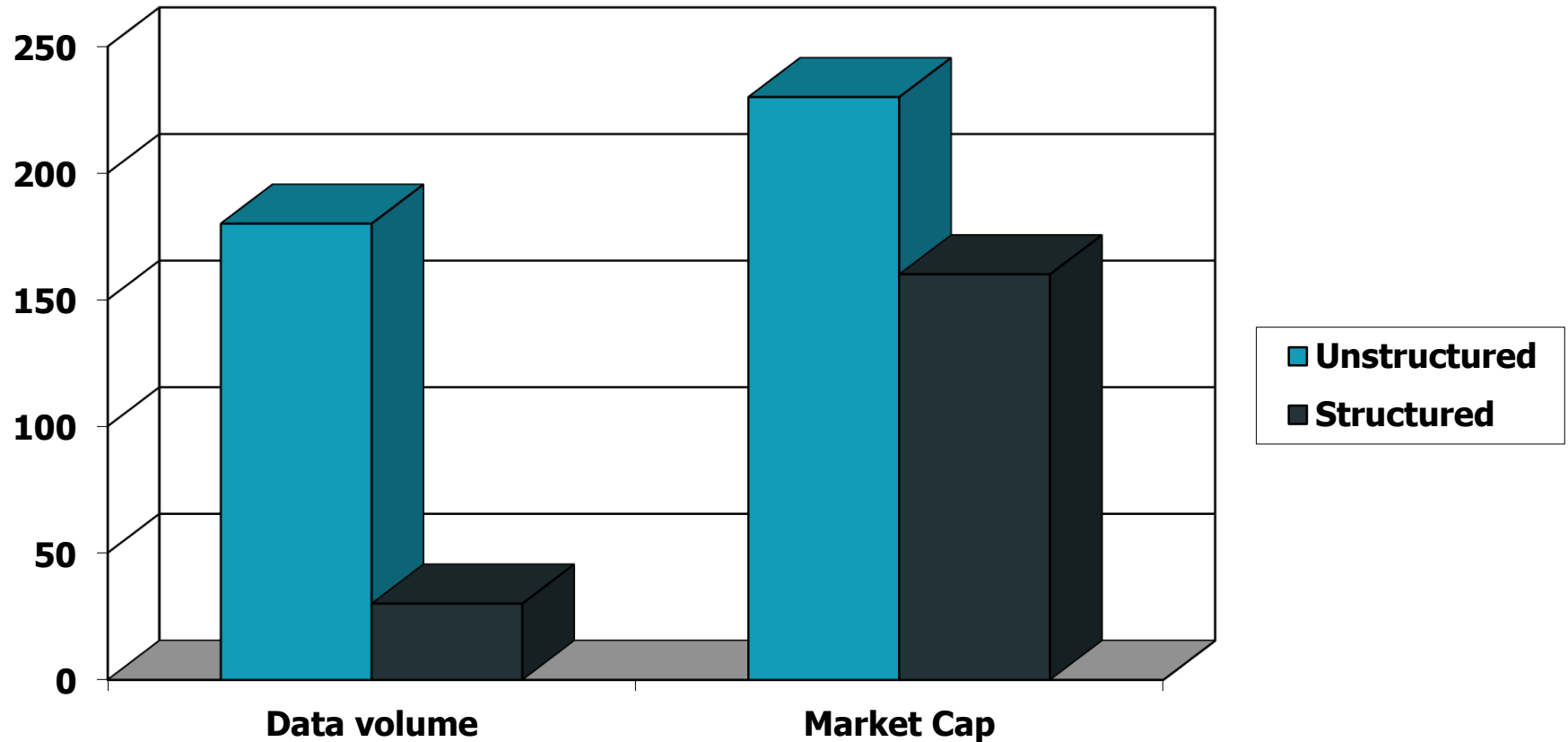
Audio, video...  
as

Total Enterprise Data Growth 2005-2015, IDC 2012

# Unstructured (text) vs. structured (database) data in the mid-nineties



# Unstructured (text) vs. structured (database) data today





# Why information retrieval

- An essential tool to deal with information overload



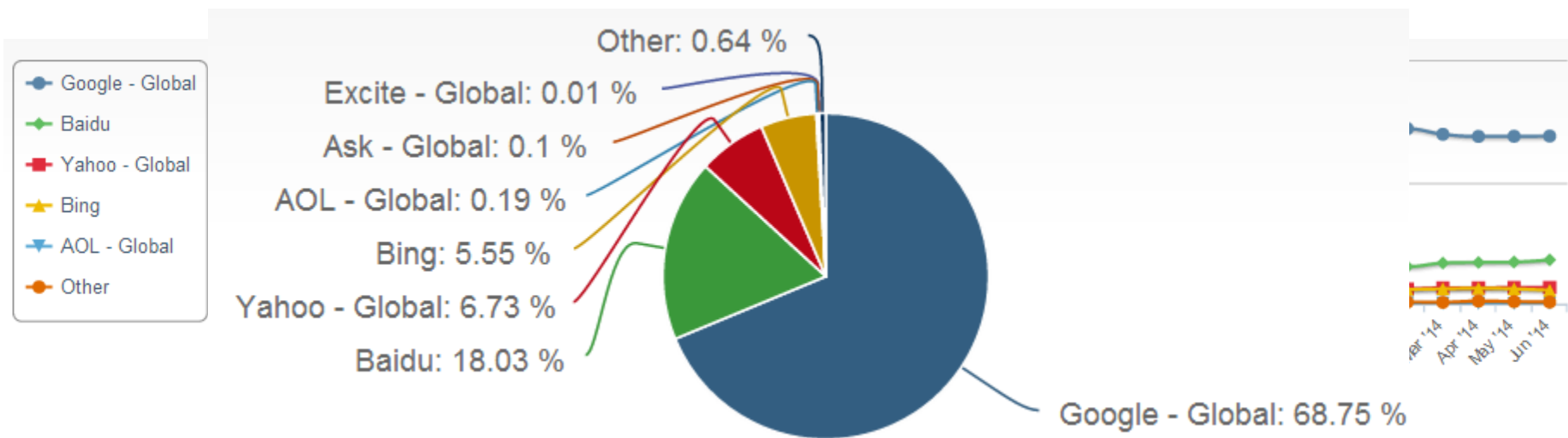
You are  
here!

# History of information retrieval

- Catalyst
  - Industry: web search engines
    - WWW unleashed explosion of published information and drove the innovation of IR techniques
    - Lycos (started at CMU) was launched and became a major commercial endeavor in 1994
    - Booming of search engine industry: *Magellan, Excite, Infoseek, Inktomi, Northern Light, AltaVista, Yahoo!, Google, and Bing*

# Major players in this game

- Global search engine market
  - By <http://marketshare.hitslink.com/search-engine-market-share.aspx>

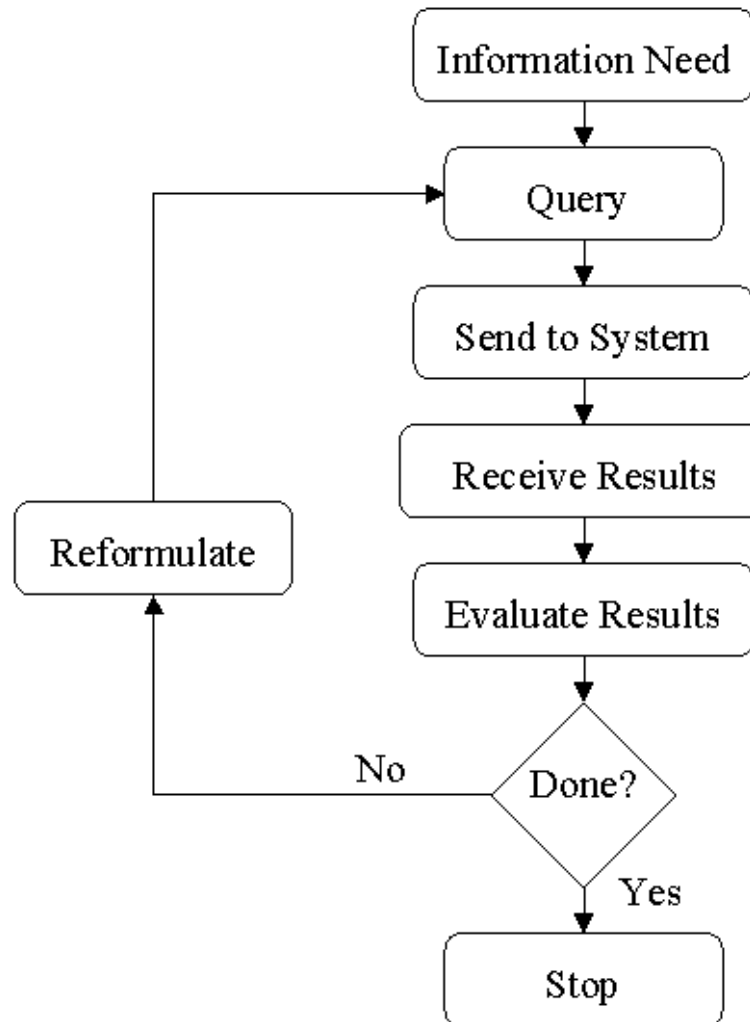


# How to perform information retrieval

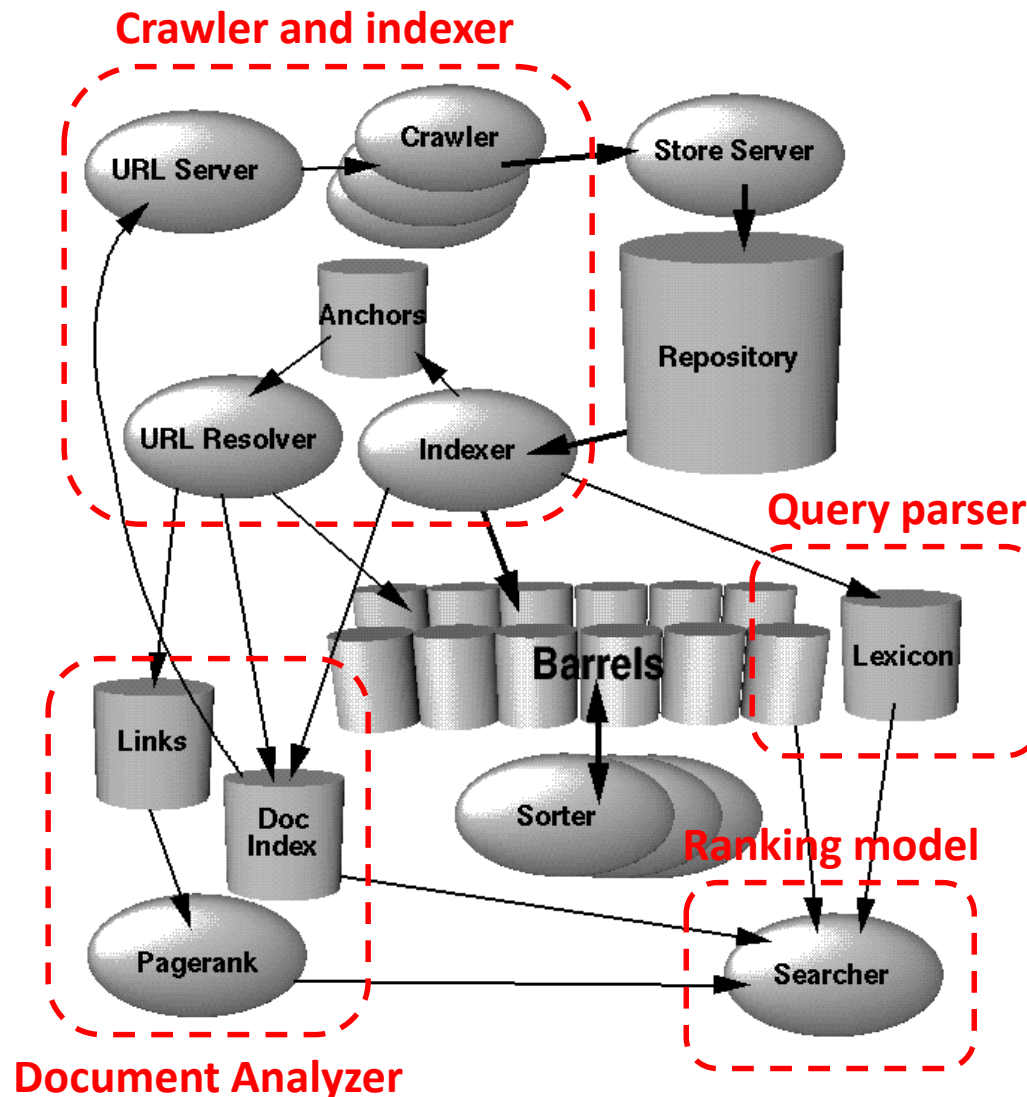
- Information retrieval when we did not have a computer



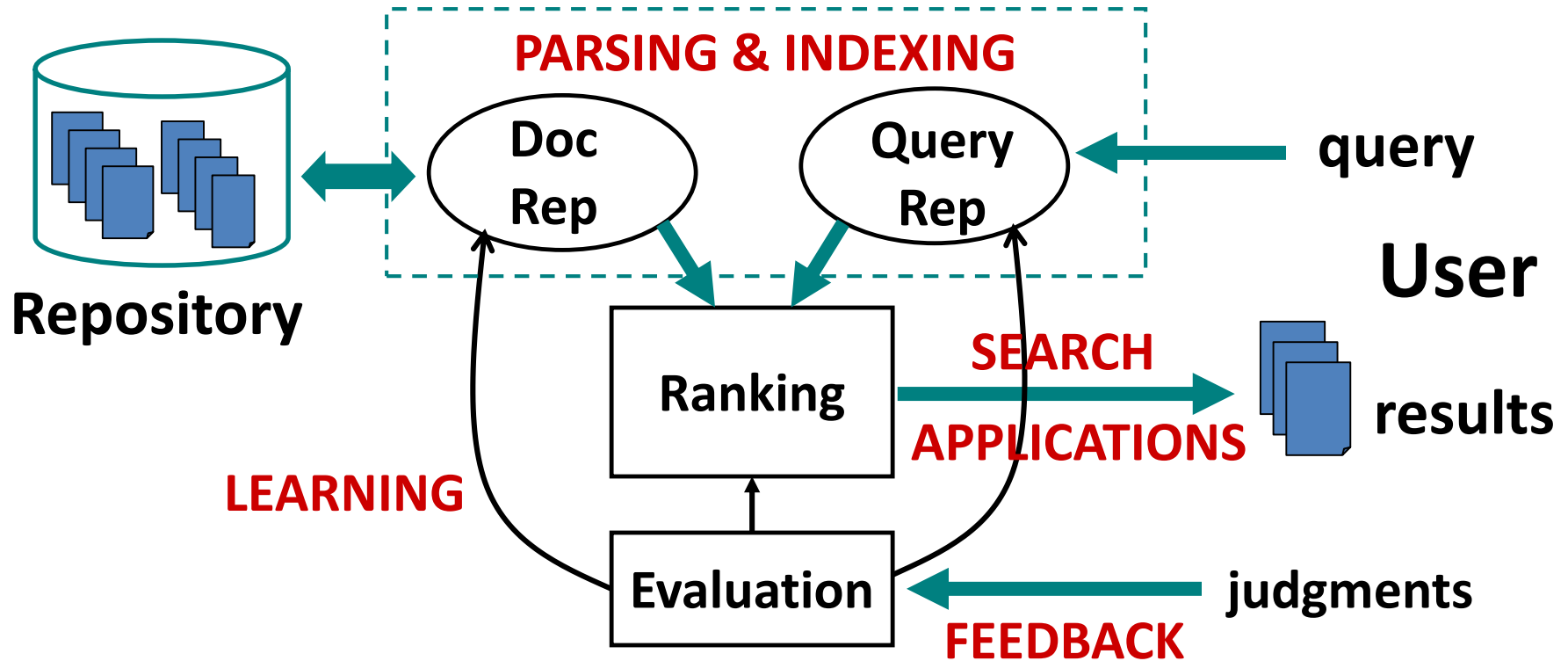
# The Standard Retrieval Interaction Model



# How to perform information retrieval



# How to perform information retrieval



## We will cover:

- 1) Search engine architecture;
- 2) Retrieval models;
- 3) Retrieval evaluation;
- 4) Relevance feedback;
- 5) Link analysis;
- 6) Search applications.

# Core concepts in IR

- Query representation
  - Lexical gap: say v.s. said
  - Semantic gap
- Document representation
  - Specific data structure for efficient access
- Retrieval model
  - Algorithms that find the most relevant documents for the given information need



# A glance of modern search engine

- In old times



# A glance of modern search engine

In modern time



# A glance of modern search engine

Google

NU pakistan

Demand of understanding

All News Videos Images Maps More

About 20,000,000 results (0.90 seconds)

Demand of efficiency

Demand of accuracy

FAST-NU  
[www.nu.edu.pk/](http://www.nu.edu.pk/)  
Our vision is to become a globally recognized research university of Pakistan within the next ... FAST-NU, Islamabad Campus is organizing convocation 2017.  
Lahore Campus · Admission Schedule · How To Apply · Islamabad Campus

National University of Computer and Emerging Sciences - Wikipedia  
[https://en.wikipedia.org/.../National\\_University\\_of\\_Computer\\_and\\_Emerging\\_Scienc...](https://en.wikipedia.org/.../National_University_of_Computer_and_Emerging_Scienc...)  
The National University of Computer and Emerging Sciences is a private research university in Pakistan. It has multiple campuses based in cosmopolitan cities of Pakistan and has .... Geek even was held in FAST-NU Lahore. more than 1,000 students from all over the country are participating in the Geek Week 2016 at the ...

pakistan | NU - Het laatste nieuws het eerst op NU.nl  
[www.nu.nl/tag/pakistan](http://www.nu.nl/tag/pakistan) Translate this page  
NU.nl; pakistan ... 16 uur geleden Buitenland Zeker vijftien doden bij bomaanslag in Pakistan Een aanslag op een militair voertuig in Pakistan heeft zaterdag ...

Tiden i Karachi, Pakistan nu - Time.is

Demand of diversity

Demand of convenience

 See photos



National University of Computer and Emerging Sciences ★

Private university in Islamabad, Pakistan

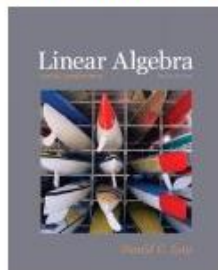
Website Directions

The National University of Computer and Emerging Sciences is a private research university in Pakistan. It has multiple campuses based in cosmopolitan cities of Pakistan and has distinction of being the first multi-campus university in Pakistan. [Wikipedia](#)

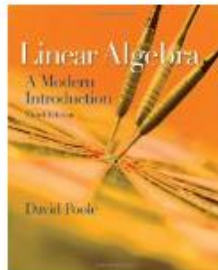
# IR is not just about web search

- Web search is just one important area of information retrieval, but not all
- Information retrieval also includes
  - Recommendation

## Recommended Based on Your Browsing History



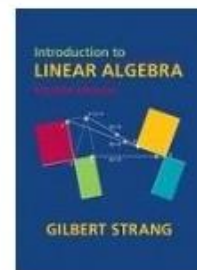
Linear Algebra and Its Applications...  
› David C. Lay  
Hardcover  
★★★★☆ (84)  
~~\$183.33~~ **\$141.16**



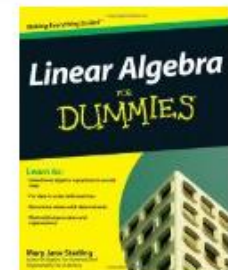
Linear Algebra: A Modern Introduction  
› David Poole  
Hardcover  
★★★★★ (41)  
~~\$316.95~~ **\$289.88**



Linear Algebra  
› G. E. Shilov  
Paperback  
★★★★☆ (34)  
~~\$48.95~~ **\$12.65**



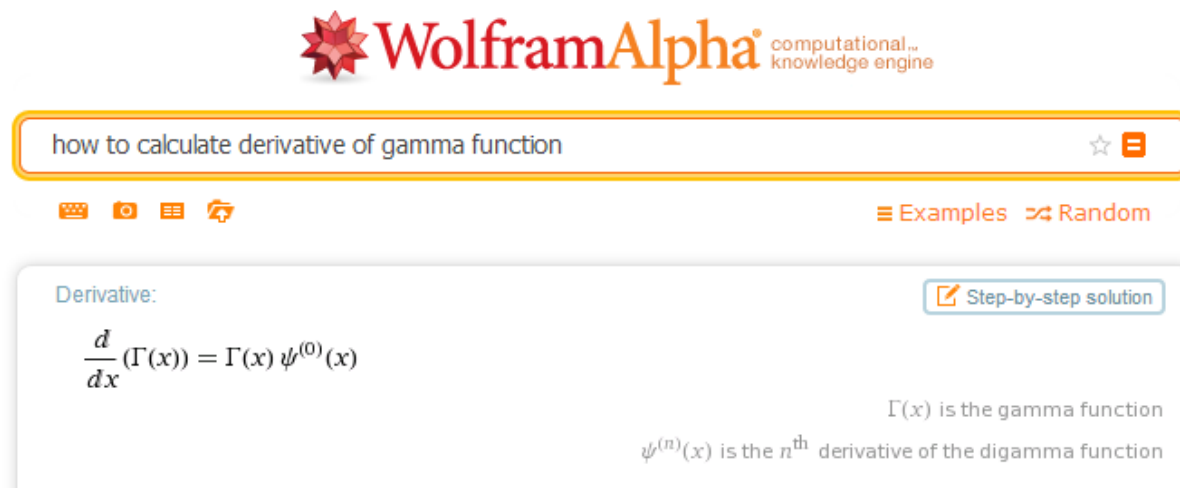
Introduction to Linear Algebra...  
› Gilbert Strang  
Hardcover  
★★★★☆ (57)  
~~\$87.50~~ **\$83.13**



Linear Algebra For Dummies  
› Mary Jane Sterling  
Paperback  
★★★★☆ (29)  
~~\$49.99~~ **\$16.23**

# IR is not just about web search

- Web search is just one important area of information retrieval, but not all
- Information retrieval also includes
  - Question answering



The screenshot shows the WolframAlpha interface. At the top is the WolframAlpha logo with the tagline "computational... knowledge engine". Below the logo is a search bar containing the text "how to calculate derivative of gamma function". To the right of the search bar are a star icon and a menu icon. Below the search bar are several icons: a keyboard, a camera, a list, and a refresh icon. To the right of these icons are the links "Examples" and "Random". Below the search bar is a box containing the text "Derivative:" and a button labeled "Step-by-step solution". The main result is the equation  $\frac{d}{dx}(\Gamma(x)) = \Gamma(x) \psi^{(0)}(x)$ . Below this equation, there is a note: " $\Gamma(x)$  is the gamma function" and " $\psi^{(n)}(x)$  is the  $n^{\text{th}}$  derivative of the digamma function".

WolframAlpha computational... knowledge engine

how to calculate derivative of gamma function

Examples Random

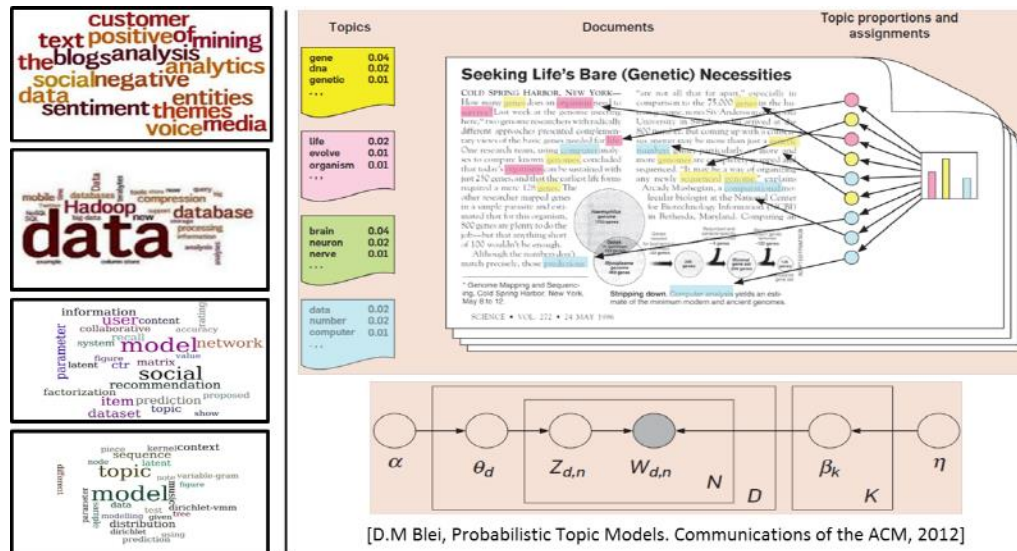
Derivative: [Step-by-step solution](#)

$$\frac{d}{dx}(\Gamma(x)) = \Gamma(x) \psi^{(0)}(x)$$

$\Gamma(x)$  is the gamma function  
 $\psi^{(n)}(x)$  is the  $n^{\text{th}}$  derivative of the digamma function

# IR is not just about web search

- Web search is just one important area of information retrieval, but not all
- Information retrieval also includes
  - Text mining



[D.M Blei, Probabilistic Topic Models. Communications of the ACM, 2012]

# IR is not just about web search

- Web search is just one important area of information retrieval, but not all
- Information retrieval also includes
  - Online advertising

The image shows a Google search results page for the query "health care". The search bar at the top shows "health care" with a microphone icon and a search button. Below the search bar, there are tabs for "Web", "News", "Images", "Maps", "Books", "More", and "Search tools". The search results indicate "About 782,000,000 results (0.45 seconds)".

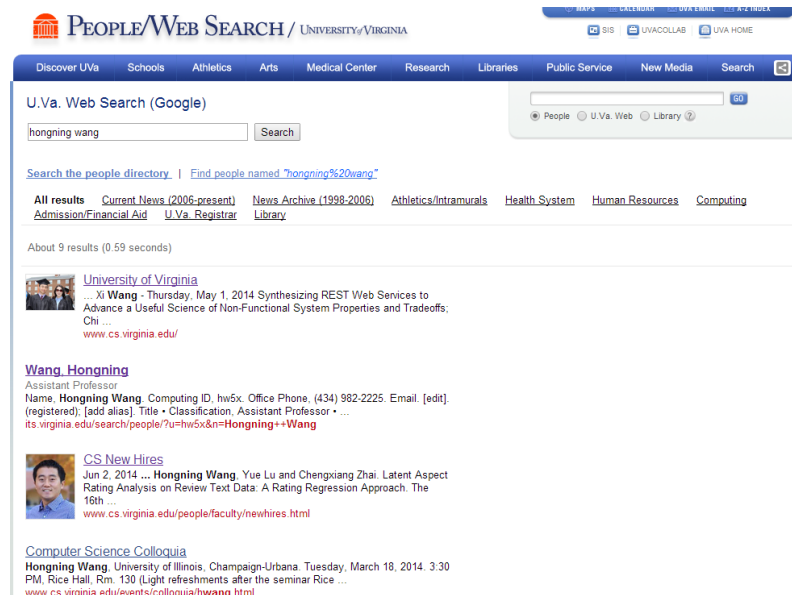
Two red dashed boxes highlight sponsored advertisements:

- Left Box:** Contains three ads for health insurance. The first is "Need Health Insurance? - MolinaHealthcare.com" with a phone number (877) 751-0665. The second is "Cheap Health Insurance - Only Takes A Few Minutes" with a phone number (888) 699-8397. The third is "Low Cost Health Insurance - IndividualHealthQuotes.com" with a phone number (866) 406-0696.
- Right Box:** Contains three ads. The first is "\$19 Health Insurance" from "affordable-health-insurance-plans.org/". The second is "Christie Clinic" from "www.christieclinic.com/". The third is "Obama Health Care" from "www.obama-care.org/".

Below the ads, there are organic search results for "HealthCare.gov: Health Insurance Marketplace, Affordable ..." and "Individuals & Families".

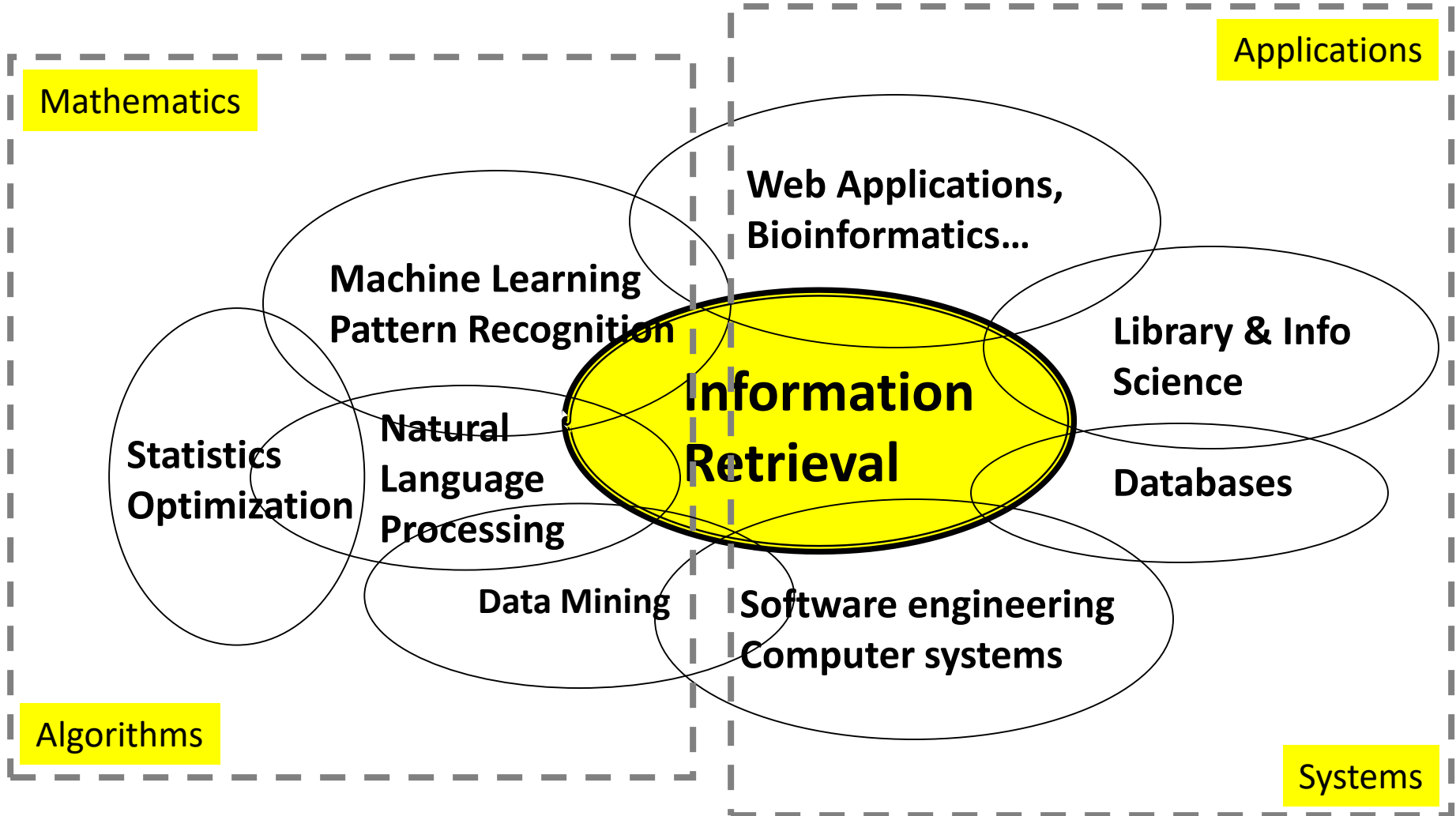
# IR is not just about web search

- Web search is just one important area of information retrieval, but not all
- Information retrieval also includes
  - Enterprise search: web search + desktop search





# Related Areas



# IR v.s. DBs

- Information Retrieval:
  - Unstructured data
  - Semantics of object are subjective
  - Simple key work queries
  - Relevance-drive retrieval
  - Effectiveness is primary issue, though efficiency is also important
- Database Systems:
  - Structured data
  - Semantics of each object are well defined
  - Structured query languages (e.g., SQL)
  - Exact retrieval
  - Emphasis on efficiency

# IR and DBs are getting closer

- IR => DBs

- Approximate search is available in DBs
- Eg. in MySQL

```
mysql> SELECT * FROM articles  
-> WHERE MATCH (title,body)  
    AGAINST ('database');
```

- DBs => IR

- Use information extraction to convert unstructured data to structured data
- Semi-structured representation: XML data; queries with structured information

# IR v.s. NLP

- Information retrieval
  - Computational approaches
  - Statistical (shallow) understanding of language
- Natural language processing
  - Cognitive, symbolic and computational approaches
  - Semantic (deep) understanding of language

# IR and NLP are getting closer

- IR => NLP
  - Larger data collections
  - Scalable/robust NLP techniques, e.g., translation models
- NLP => IR
  - Deep analysis of text documents and queries
  - Information extraction for structured IR tasks

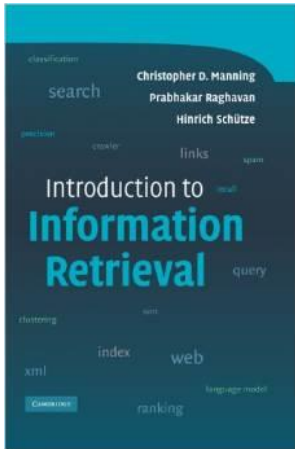
# Course Learning Objectives

- Enable students to understand the common algorithms and techniques for information retrieval (document indexing and retrieval, query processing, etc )
- Introduce the quantitative evaluation methods for the IR systems and data mining techniques
- Enable students to implement a basic textual information retrieval system using Java or Python
- Introduce the popular probabilistic retrieval methods and ranking principles
- Introduce the techniques and algorithms existing in practical retrieval and data mining systems such as those in web search engines and recommender systems

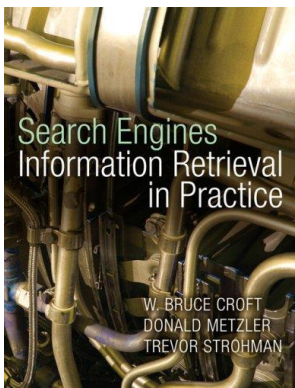
# Course Outline

<b>Inverted Index Construction</b> Posting Lists, Dictionary
<b>Text Preprocessing</b> Tokenization Stopping, stemming
<b>Retrieval Models (Vector Space Models)</b> Vector-space model, Cosine Similarity, Tf-Idf, BM25
<b>Retrieval Models ( Language Models)</b> Smoothing Methods
<b>Relevance Feedback</b>
<b>IR Evaluation/ Measures</b> Ranking measures: R-prec, Mean Average Precision, nDCG, Reciprocal Rank
<b>Web Retrieval</b> Link analysis, Markov Chains, PageRank
<b>Recommendation Systems/ Collaborative Filtering</b>
<b>Semantic Similarity Measures</b> Word Net, Skipgrams
<b>Word Embedding</b>
<b>Text Classification</b> Naive Bayes, KNN
<b>Clustering</b> K-means clustering

# Text books



- ***Introduction to Information Retrieval.*** Christopher D. Manning, Prabhakar Raghavan, and Hinrich Schuetze, Cambridge University Press, 2007.



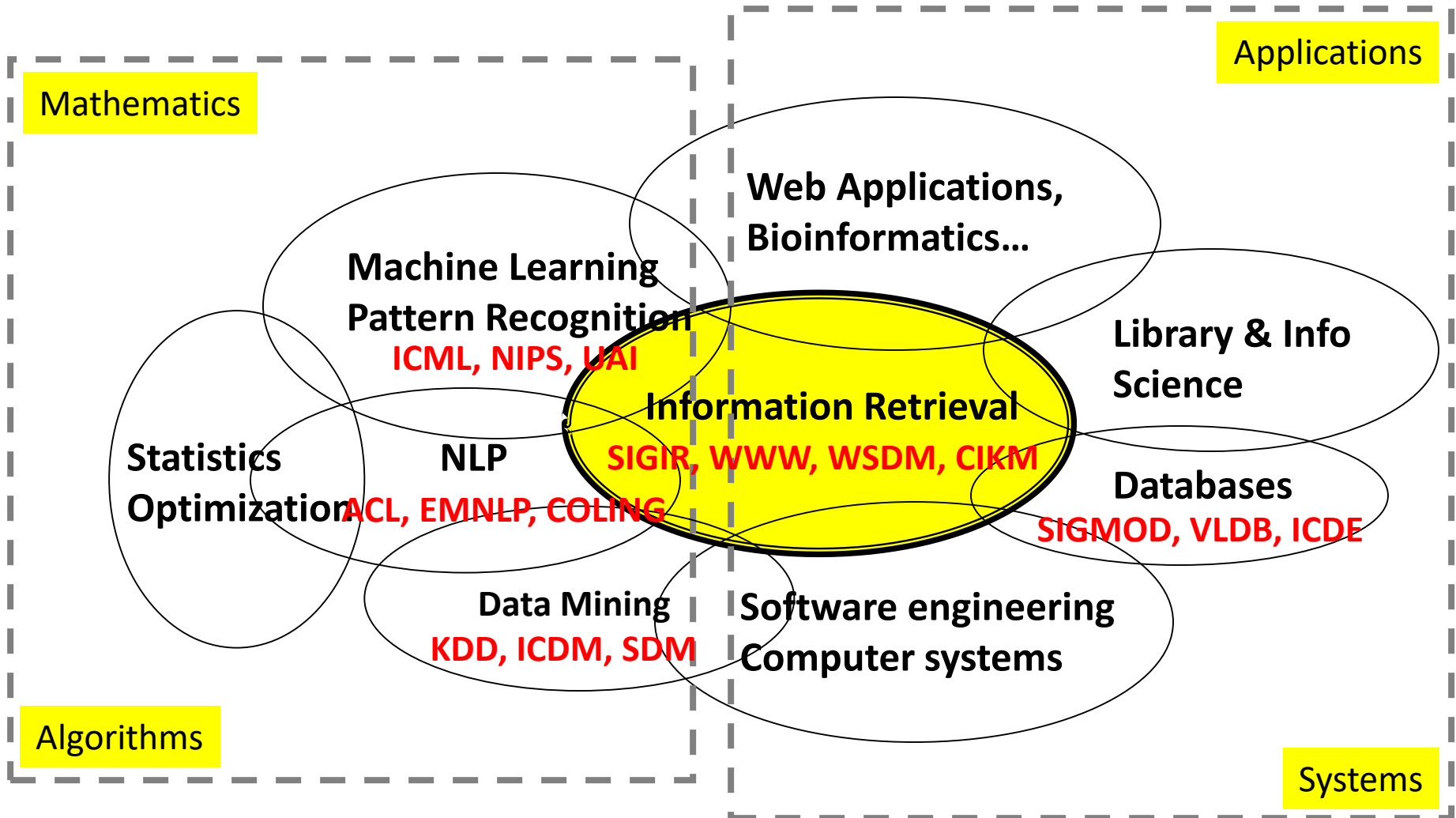
- ***Search Engines: Information Retrieval in Practice.*** Bruce Croft, Donald Metzler, and Trevor Strohman, Pearson Education, 2009.



# You should know

- IR originates from library science for handling unstructured data
- IR has many important application areas, e.g., web search, recommendation, and question answering
- IR is a highly interdisciplinary area with DBs, NLP, ML, HCI

# What to read?



# Top Conferences and Journals in IR Field

- [SIGIR](#): One of the most important and influential conference in IR field (attract more attention from academia), proceedings of publications can be found [here](#).
- [WWW](#): Another most important and influential conference in IR field (attract more attention from industry), proceedings of publications can be found [here](#).
- [WSDM](#): A new but quickly raising conference in the field, attracting attentions from both industry and academia. Proceedings of publications can be found [here](#).
- [CIKM](#): A major conference in IR field. Proceedings of publications can be found [here](#).
- [ECIR](#) Conference Proceedings
  
- [TOIS](#): One of major journals for IR field.
- Information Processing and Management (Journal)
- Knowledge and Data Engineering (Journal)
- Information Retrieval (Journal)
- Information Science (Journal)
- Knowledge Based systems (Journal)

# IR Toolkits

- [Lucene](#) (Apache)
- [Lemur & Indri](#) (CMU/Univ. of Massachusetts)
- [Terrier](#) (Glasgow)
- [MeTA](#) (University of Illinois)
- [RankLib](#) (A collection of learning-to-rank algorithms University of Massachusetts Amherst)
- [General Information Retrieval Systems](#)

# NLP-related Resources

- [Statistical natural language processing and corpus-based computational linguistics: An annotated list of resources](#)
- [Stanford NLP parser](#) (Stanford University NLP group)
- [OpenNLP](#) (Apache)
- [LingPipe](#) (Java-based)
- [NLTK](#) (Python-based)

# Machine Learning Toolkits

- [Weka](#) (A rich collection of machine learning algorithms, Machine Learning Group at the University of Waikato)
- [Mallet](#) (An alternative package for Weka, developed by Andrew McCallum at University of Massachusetts Amherst)
- [LibSVM](#) (A collection of SVMs, developed by Chih-Chung Chang and Chih-Jen Lin at National Taiwan University)
- [SVM-light](#) (Another collection of SVMs, developed by Thorsten Joachims at Cornell University)
- [GraphLab](#) (Large-scale machine learning package)
- [mahout](#) (Apache large-scale machine learning package)
- [Topic Models](#) (David Blei's collection of various topic models)

# Percentage Grade Distribution

	<b>Number</b>	<b>Total Weight (%)</b>
Quizes	3	10
Programming Assignments	2	10
Project	1	10
Midterm	2	25
Final Exam	1	45

# Plagiarism Policy

You are not allowed to copy code for programming assignments from internet or any other student. Penalty of plagiarism in programming assignments will be from one of the following depending on severity of case:

- -1 absolute from final grade
- Final grade is lowered
- F in course



# Slide Credits

- Dr. ChengXiang Zhai
- Lecture Notes, Text Retrieval and Mining by Christopher Manning and Prabhakar Raghavan, Stanford University