

# INLS 509: Introduction to Information Retrieval

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# Outline

## Introductions

What is information retrieval (IR)?

What is a search engine?

Why is information retrieval difficult?

How do search engines predict relevance?

How good is a search engine?

# Introductions

- Hello, my name is \_\_\_\_\_.
- However, I'd rather be called \_\_\_\_\_. (optional)
- I'm in the \_\_\_\_\_ program.
- I'm taking this course because I want to \_\_\_\_\_.



# What is Information Retrieval?

- Information retrieval (IR) is a field concerned with the design, development, and evaluation of interactive systems that help users find information.

# What is Information Retrieval?


- This course mainly focuses on search engines
- Given a **query** and a **corpus**, find **relevant** items
  - query**: a user's expression of their information need
  - corpus**: a repository of retrievable items
  - relevance**: satisfaction of the user's information need

# What is Information Retrieval?

- Gerard Salton, 1968:

Information retrieval is a field concerned with the structure, analysis, organization, storage, and retrieval of information.

# Information Retrieval structure

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## Gerard Salton

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**Gerard Salton** (8 March 1927 in [Nuremberg](#) - 28 August 1995), also known as Gerry Salton, was a Professor of [Computer Science](#) at [Cornell University](#). Salton was perhaps the leading computer scientist working in the field of [information retrieval](#) during his time. His group at Cornell developed the [SMART Information Retrieval System](#), which he initiated when he was at Harvard.

Salton was born Gerhard Anton Sahlmann on March 8, 1927 in [Nuremberg, Germany](#). He received a Bachelor's (1950) and Master's (1952) degree in mathematics from [Brooklyn College](#), and a Ph.D. from [Harvard](#) in [Applied Mathematics](#) in 1958, the last of [Howard Aiken](#)'s doctoral students, and taught there until 1965, when he joined [Cornell University](#) and co-founded its department of Computer Science.

Salton was perhaps most well known for developing the now widely used [Vector Space Model](#) for Information Retrieval<sup>[1]</sup>. In this model, both documents and queries are represented as vectors of term counts, and the similarity between a document and a query is given by the cosine between the term vector and the document vector. In this paper, he also introduced [TF-IDF](#), or term-frequency-inverse-document frequency, a model in which the score of a term in the a document is the ratio of the number of terms in that document divided by the frequency of the number of documents in which that term occurs. (The concept of inverse document frequency, a measure of specificity, had been introduced in 1972 by [Karen Sparck-Jones](#)<sup>[2]</sup>.) Later in life, he became interested in automatic text summarization and analysis<sup>[3]</sup>, as well as automatic hypertext generation<sup>[4]</sup>. He published over 150 research articles and 5 books during his life.

Salton was editor-in-chief of the [Communications of the ACM](#) and the [Journal of the ACM](#), and chaired [SIGIR](#). He was an associate editor of the [ACM Transactions on Information Systems](#). He was an [ACM Fellow](#) (elected 1995), received an Award of Merit from the [American Society for Information Science](#) (1989), and was the first recipient of the [SIGIR Award](#) for outstanding contributions to study of information retrieval (1983) -- now called the [Gerard Salton Award](#).

## References


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- <sup>↑</sup> G. Salton , A. Wong , C. S. Yang, A vector space model for automatic indexing [↗](#), Communications of the ACM, v.18 n.11, p.613-620, Nov. 1975
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However, the main content of the page is in the form of natural language text, which has little structure that a computer can understand

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However, the main content of the page is in the form of natural language text,

W

As it turns out, it's not necessary for a computer to understand natural language text for it to determine that this document is likely to be relevant to a particular query (e.g., "Gerard Salton")

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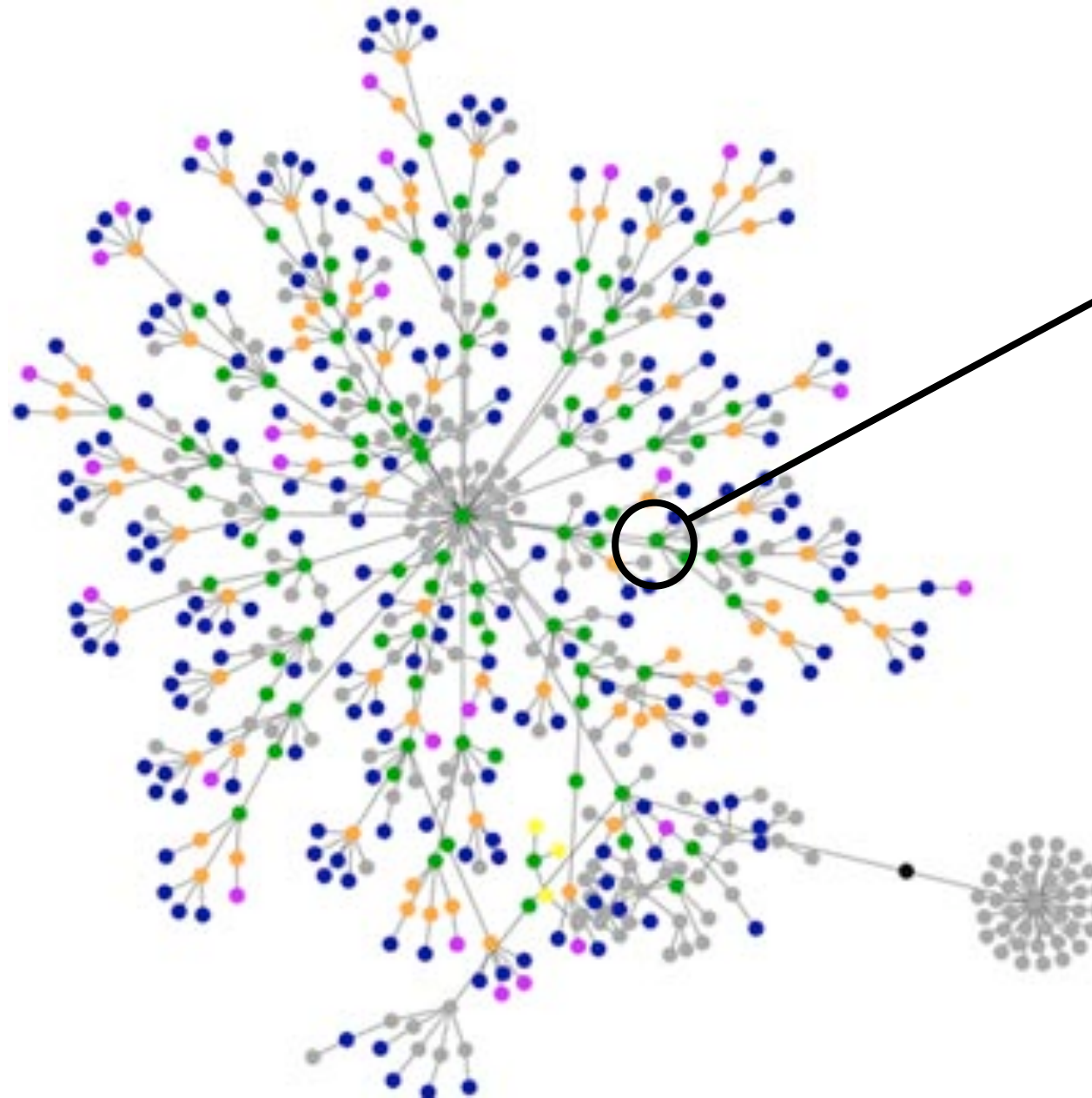
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## References

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- <sup>↑</sup> [G. Salton , A. Wong , C. S. Yang, A vector space model for automatic indexing](#), Communications of the ACM, v.18 n.11, p.613-620, Nov. 1975
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# Information Retrieval

## analysis: classification and information extraction



The screenshot shows the Wikipedia article for Gerard Salton. The page layout includes a sidebar on the left with navigation links like 'Main page', 'Contents', and 'Interaction'. The main content area has tabs for 'Article', 'Discussion', 'Read', 'Edit', and 'View history'. The article text describes Salton's birth (1927) and death (1995), his education at Cornell and Harvard, and his contributions to information retrieval, including the development of the SMART system and the Vector Space Model. It also mentions his role as editor-in-chief of the Communications of the ACM and the Journal of the ACM, and his receipt of the SIGIR Award. The 'References' section at the bottom lists two sources: a paper by G. Salton, A. Wong, and C. S. Yang (1975) and a paper by Karen Sparck-Jones (1972).

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**References** [[edit](#)]

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Categories: 1927 births | 1995 deaths | American computer scientists | Computer pioneers | Harvard University alumni | Harvard University faculty | Cornell University faculty | Fellows of the Association for Computing Machinery | Guggenheim Fellows

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blues clues

About 12,800 results (0.18 seconds)

Reading level › Advanced

Results by reading level for **blues clues** - [View results for all reading levels](#)

Basic	66%	
Intermediate	30%	
Advanced	4%	

► [Blue - Wikipedia, the free encyclopedia](#) 🔍

[en.wikipedia.org/wiki/Blue](https://en.wikipedia.org/wiki/Blue) - Cached

**Blue** is a colour, the perception of which is evoked by light having a spectrum dominated by energy with a wavelength of roughly 440–490 nm. ...

[Images for blues clues](#) - Report images

[Researching Blue's Clues: Viewing behavior and impact](#) 🔍

[www.cmch.tv/research/fullrecord.asp?id=1773](http://www.cmch.tv/research/fullrecord.asp?id=1773) - Cached

Year: 2000. Article Title: Researching **Blue's Clues**: Viewing behavior and impact. Journal: Media Psychology. Volume: 2. Edition: Issue: 2. Pages: 179-194 ...

[Do children learn how to watch television? The impact of extensive ...](#) 🔍

[www.cmch.tv/research/fullrecord.asp?id=1932](http://www.cmch.tv/research/fullrecord.asp?id=1932) - Cached

The impact of extensive experience with **Blues Clues** on preschool children's ...

**Design: Trials comparing TV comprehension, behavior of 2 groups: experienced **Blue's Clues** viewers and inexperienced viewers. Study 1: Subjects viewed unseen ...**

Researcher: [Name], [Institution], [Address], [City], [State], [Zip]

Year: 2000

Title: [Title]

Abstract: [Abstract text]


Keywords: [Keywords]

Summary: [Summary text]

References: [References list]

# Information Retrieval

## organization: recommendations



Real people. Real reviews.®

Search for (e.g. taco, cheap dinner, Max's)

cosmic cantina

Near (Address, City, State or Zip)

Chapel Hill, NC

Search

[Welcome](#) [About Me](#) [Write a Review](#) [Find Reviews](#) [Invite Friends](#) [Messaging](#) [Talk](#) [Events](#) [Member Search](#)

### Cosmic Cantina

★★★★☆ 41 reviews [Rating Details](#)

Category: [Mexican](#) [Edit]

128 E Franklin St  
Chapel Hill, NC 27514

(919) 960-3955

Price Range: \$

Accepts Credit Cards: Yes

Parking: Street

Attire: Casual

Good for Groups: No


Good for Kids: Yes

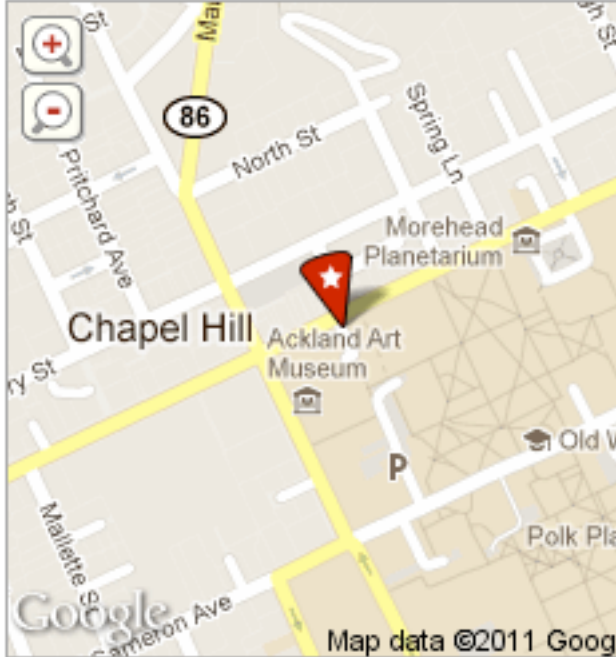
Takes Reservations: No

Delivery: No

Take-out: Yes





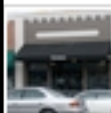
Walter Service: No





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#### People Who Viewed This Also Viewed...

-  **The Cosmic Cantina**  
★★★★☆ 84 reviews  
Durham, NC
-  **Carrburritos**  
★★★★☆ 93 reviews  
Carrboro, NC
-  **Joe's Joint**  
★★★★☆ 8 reviews  
Chapel Hill, NC
-  **Bandido's Mexican Cafe**  
★★★★☆ 20 reviews  
Chapel Hill, NC
-  **Pepper's Pizza**  
★★★★☆ 74 reviews  
Chapel Hill, NC

<http://www.yelp.com/biz/cosmic-cantina-chapel-hill>  
(not actual page)


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# Information Retrieval storage



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phone: (630) 781-3898

Office hours: By appointment

### Research Interests

I conduct research in Information Retrieval (IR). Within IR, my main focus has been on aggregated search—the task of providing users with integrated access to multiple systems within a single search interface. In particular, my focus is on aggregated search within the context of Web search. In addition to retrieving Web pages, commercial search engines also function as a single point of access to specialized services known as verticals (e.g., image search, video search, news search, local search, driving directions, weather forecasts, etc.). My methods address the task of deciding which verticals to show (if any) and where to show them. In addition to IR, I am also interested in machine learning, text data-mining, and human-computer interaction.

### Publications

**2011**

Jaime Arguello, Fernando Diaz, and Jamie Callan. Learning to Aggregate Vertical Results into Web Search Results. 20th ACM Conference on Information and Knowledge Management (CIKM'11), To Appear.

Jaime Arguello, Fernando Diaz, Jamie Callan, and Ben Carterette. [A Methodology for Evaluating Aggregated Search Results](#). In Proceedings of the 33rd European Conference on Information Retrieval. (ECIR'11), 2011. (Best Student Paper Award)

**2010**

Jaime Arguello, Fernando Diaz, and Jean-François Paiement. [Vertical Selection in the Presence of Unlabeled Verticals](#). In Proceedings of the 33rd Annual International ACM SIGIR Conference on Research & Development on Information Retrieval (SIGIR'10), 2010.



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**Economy Added 117,000 Jobs in July; Rate Falls to 9.1%**  
By MOTOKO RICH 9:58 AM ET  
The job growth figure, reported by the Labor Department, was the strongest since April, but may still not be high enough to relieve fears of a renewed recession.

• Economic: Government Jobs Down | Seasonal Adjustments  
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### Wall Street Rally Quickly Fizzles

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Shares wavered, taking back most of their opening gains after the employment report on Friday.

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THE LEDE  
**Live Blog: The Markets**  
By CHRISTINE HAUSER 48 minutes ago  
The E.U.'s top finance official said insufficient information might have been a factor in the recent market turmoil.

RELATED COVERAGE  
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• Double Dip Recession May Be Happening  
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Economists and business people look for a bright spot, amid the gloom.

• Krugman: The Wrong Worries  
• Boylan: This Astronomical Recession  
• Editorial: Debt Limit  
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• Nye: The Right Way to Trim

### WHAT'S POPULAR NOW

• The Wrong Worries  
• Time to Say It: Double Dip May Be Happening

### MARKETS »

At 11:44 AM ET

S&P 500	Dow	Nasdaq
1,184.58	11,284.08	2,508.32
-15.49	-99.60	-48.07
-1.29%	-0.87%	-1.88%

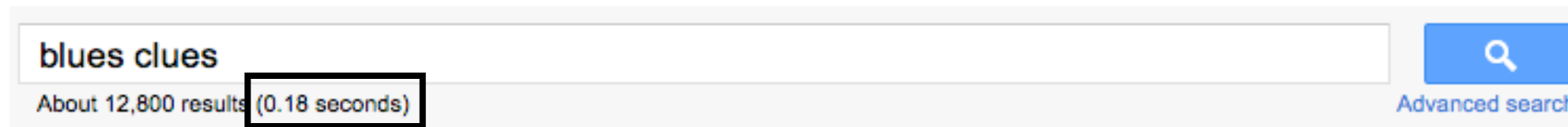
GET QUOTES My Portfolios »  
Stock, ETFs, Funds Go

UPGRADE YOUR TIMES EXPERIENCE. Become a Digital Subscriber. CLICK FOR DETAILS

- How might a web search engine view these pages differently in terms of storage?

# Information Retrieval

## retrieval



A screenshot of a search engine interface. The search bar contains the text "blues clues". Below the search bar, it says "About 12,800 results (0.18 seconds)". To the right of the search bar is a blue button with a magnifying glass icon. Below the button is the text "Advanced search".

- **Efficiency:** retrieving results in this lifetime (or, better yet, in 0.18 seconds)
- **Effectiveness:** retrieving results that satisfy the user's information need (more on this later)
- We will focus more on effectiveness
- However, we will also discuss in some detail how search engines retrieve results as fast as they do

# Outline

## Introductions

What is information retrieval (IR)?

What is a search engine?

Why is information retrieval difficult?

How do search engines predict relevance?

How good is a search engine?



# Many Types of Search Engines



# Many Types of Search Engines



PANDORA

Google



match.com

mapquest m<sup>q</sup>



YAHOO! ANSWERS

flickr



LinkedIn

Westlaw

The New York Times



YouTube  
Broadcast Yourself™



# The Search Task

- Given a **query** and a **corpus**, find **relevant** items
  - query**: user's expression of their information need
  - corpus**: a repository of retrievable items
  - relevance**: satisfaction of the user's information need

# Search Engines

## web search

query

results

facebook and productivity

Study: Facebook use cuts productivity at work - Computerworld  
www.computerworld.com > Internet > Web 2.0 and Web Apps - Cached  
Jul 22, 2009 - A Nucleus Research study found that Facebook work in the workplace is cutting employee productivity.

Pulling the Plug on Facebook, Productivity/Time Management Article ...  
www.inc.com > Leadership and Managing > Human Resources - Cached  
Pulling the Plug on Facebook, Productivity/Time Management Article - All that friending and superpoking wastes a lot of time at the office -- and could be ...

Twitter and Facebook: The New Tools of Productivity or Distraction ...  
www.briansolis.com/.../twitter-and-facebook-the-new-tools-of-prod... - Cached  
Mar 26, 2010 - RT Twitter and Facebook: Yools of Productivity or Distraction .... RT @PRSAcolo: Twitter & Facebook: New tools of productivity or ...

Twitter, Facebook Can Improve Work Productivity | PCWorld Business ...  
www.pcworld.com/.../twitter\_facebook\_can\_improve\_work\_produc... - Cached  
Apr 2, 2009 - Reach Older Users on Facebook and Twitter - The Web's Best Productivity Sites. According to a study by the Australian University, ...

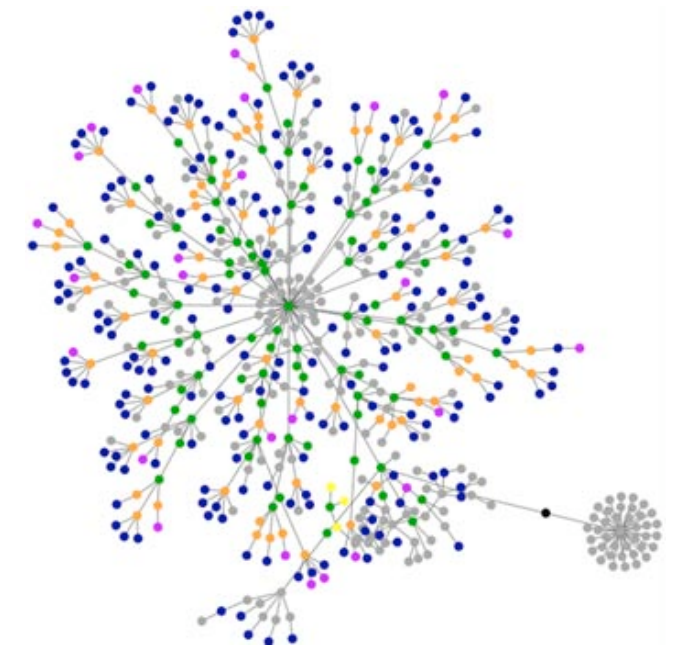
Is Facebook Killing Your Employees' Productivity? | WebProNews  
www.webpronews.com/is-facebook-killing-your-employees-produc... - Cached  
Jul 21, 2009 - On the heels of a study indicating that social media can significantly impact a brand's bottom line positively, another one has come out ...

Productivity Strategies | Facebook  
www.facebook.com/beproductive - Cached  
Productivity Strategies - To learn more about the Productive Today "Content Collaborative" faculty, click the "Info" tab or this direct link: | Facebook.

Butt Out IT! Facebook "Productivity Loss" Is No Concern of Yours  
blogs.gartner.com/.../butt-out-it-facebook-productivity-loss-is-no-co... - Cached  
Facebook "Productivity Loss" Is No Concern of Yours. by Brian Prentice | November 23, 2008 | 10 Comments. Like my colleague Anthony Bradley, I also speak to ...

Productivity Levels Plummet After Yale Student Makes Facebook Look ...  
www.betabeat.com/.../yale-student-makes-facebook-look-like-excel-... - Cached  
5 days ago - Productivity Levels Plummet After Yale Student Makes Facebook Look Like Excel. By Rebecca Panovka 7/28 6:11pm ...

corpus



web pages




# Search Engines

## digital library search


query

results

facebook productivity

- 1 [Effective teaching practices using free Google services: conference tutorial](#)  
[Paul Gestwicki](#), [Brian McNely](#)  
October 2010 **Journal of Computing Sciences in Colleges** , Volume 26 Issue 1  
**Publisher:** Consortium for Computing Sciences in Colleges  
Full text available:  [Pdf](#) (22.76 KB)  
**Bibliometrics:** Downloads (6 Weeks): 2, Downloads (12 Months): 48, Downloads (Overall): 48,

In this 90-minute tutorial, we will share our experiences using free Web services from Google teaching effectiveness. Participants will engage with these services as part of the tutorial. We have used and studied these technologies, ...

- 2 [Model-Based Engineering of Software: Three Productivity Perspectives](#)  
[Shawn A. Bohner](#), [Sriram Mohan](#)  
October 2009 **SEW '09: Proceedings of the 2009 33rd Annual IEEE Software Engineering Workshop**  
**Publisher:** IEEE Computer Society  
Full text available:  [Publisher Site](#)  
**Bibliometrics:** Downloads (6 Weeks): n/a, Downloads (12 Months): n/a, Downloads (Overall): n/a, Citation Count: 0

Evolving software products is a tricky business, especially when the domain is complex and changing rapidly. Like other fields of engineering, software engineering productivity advances have come about largely through abstraction reuse, process, and ...

**Keywords:** Agent-Based Software Systems, Model-Driven Architecture, Model-Driven Development, Model-Based Software Development, Model-Based Software Engineering

- 3 [Absolute Beginner's Guide to Computer Basics, 5th edition](#)  
[Michael Miller](#)  
September 2009 **Absolute Beginner's Guide to Computer Basics, 5th edition**  
**Publisher:** Que Publishing Company  
**Bibliometrics:** Downloads (6 Weeks): n/a, Downloads (12 Months): n/a, Downloads (Overall): n/a, Citation Count: 0

Everything casual users need to know to get the most out of their new Windows 7 PCs, software, and the Internet. The best-selling beginner's guide, now completely updated for Windows 7 and today's most popular Internet tools -

corpus



scientific  
publications

# Search Engines

## news search

query

results

### [Tropical Storm Emily Heads Toward Haiti, Dominican Republic](#)

Voice of America - 23 minutes ago

August 03, 2011 Tropical Storm **Emily** Heads Toward Haiti, Dominican Republic VOA News Tropical storm warnings and watches are posted for parts of the ...

[Video: Tropical Storm Emily on Path Toward Haiti](#)  The Associated Press

Local: [Emily could reach hurricane strength](#) Sarasota Herald-Tribune (blog)

Blog: [Mubarak Trial Begins; Tropical Storm Emily Threatens East Coast](#) NPR (blog)

[The Guardian](#) - [Fox News](#)

[all 1804 news articles »](#)

### [Emily Heads For Hispaniola](#)

WAVY-TV (blog) - Jeremy Wheeler - 2 hours ago

**Emily** has had little change in strength since yesterday. She has winds of 50mph. The pressure is down a little to 1003 mb (millibars of pressure). ...

[Tropical Storm Emily remains weak, hits Haiti tonight](#) Examiner.com

August 2, 2011 Midday Tropics Update: TS **Emily** Now Moving More ... Wakulla.com

[Emily the Effervescent](#) Caribbean Hurricane Network

[all 4 news articles »](#)

### ['Snow White' Writer to Pen Universal's 'Emily the Strange' \(Exclusive\)](#)

Hollywood Reporter - Borys Kit - 13 hours ago

Melisa Wallack, who wrote the script that became Relativity's high-profile Snow White project, has been drafted by Universal to pen **Emily the Strange**. ...

[Early Edition: Emily the Strange to Darken Big Screen; More News](#) Moviefone (blog)

[Writer Melisa Wallack Will Follow SNOW WHITE With EMILY THE STRANGE](#) Collider.com

[Details on the upcoming 'Emily the Strange' movie](#) Examiner.com

[ComingSoon.net](#) - [411mania.com](#)

[all 7 news articles »](#)

### [High heat in Midwest and South](#)

Reuters - Tim Sharp - Kevin Murphy - 22 hours ago

By Wendell Marsh WASHINGTON (Reuters) - Record-breaking heat continued to broil central and southern states on Tuesday as Tropical Storm **Emily** threatened to ...



Coastal



Collider.com



Reuters

corpus

news articles



# Search Engines

## local business search

query

results

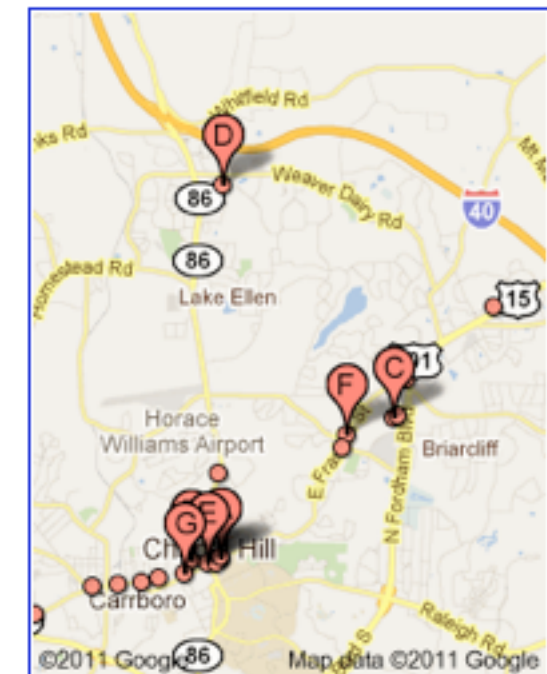
### Places for **mexican food** near Chapel Hill, NC

- A** [Bandido's Mexican Cafe & Cantina](#) - ★★★★★ 14 reviews - Place page  
[www.bandidoscafe.com](http://www.bandidoscafe.com) - 159 1/2 East Franklin Street, Chapel Hill - (919) 967-5048
- B** [Las Potrillos Mexican Restaurant](#) - ★★★★★ 9 reviews - Place page  
[www.lospotrillos.net](http://www.lospotrillos.net) - 220 West Rosemary Street, Chapel Hill - (919) 932-4301
- C** [monterrey mexican restaurant](#) - ★★★★★ 17 reviews - Place page  
[monterreychapelhill.com](http://monterreychapelhill.com) - 237 South Elliot Road, Chapel Hill - (919) 969-8750
- D** [Margaret's Cantina](#) - ★★★★★ 19 reviews - Place page  
[www.margaretscantina.com](http://www.margaretscantina.com) - 1129 Weaver Dairy Road, Chapel Hill - (919) 942-4745
- E** [Qdoba Mexican Grill](#) - ★★★★★ 19 reviews - Place page  
[www.qdoba.com](http://www.qdoba.com) - 100 West Franklin Street, Chapel Hill - (919) 929-8998
- F** [Cinco de Mayo](#) - ★★★★★ 11 reviews - Place page  
[www.cincomayorestaurants.net](http://www.cincomayorestaurants.net) - 1502 East Franklin Street, Chapel Hill - (919) 929-6566
- G** [Chipotle Mexican Grill](#) - ★★★★★ 15 reviews - Place page  
[www.chipotle.com](http://www.chipotle.com) - 301 W. Franklin St., Chapel Hill - (919) 942-2091

corpus



curated/synthesized  
business listings

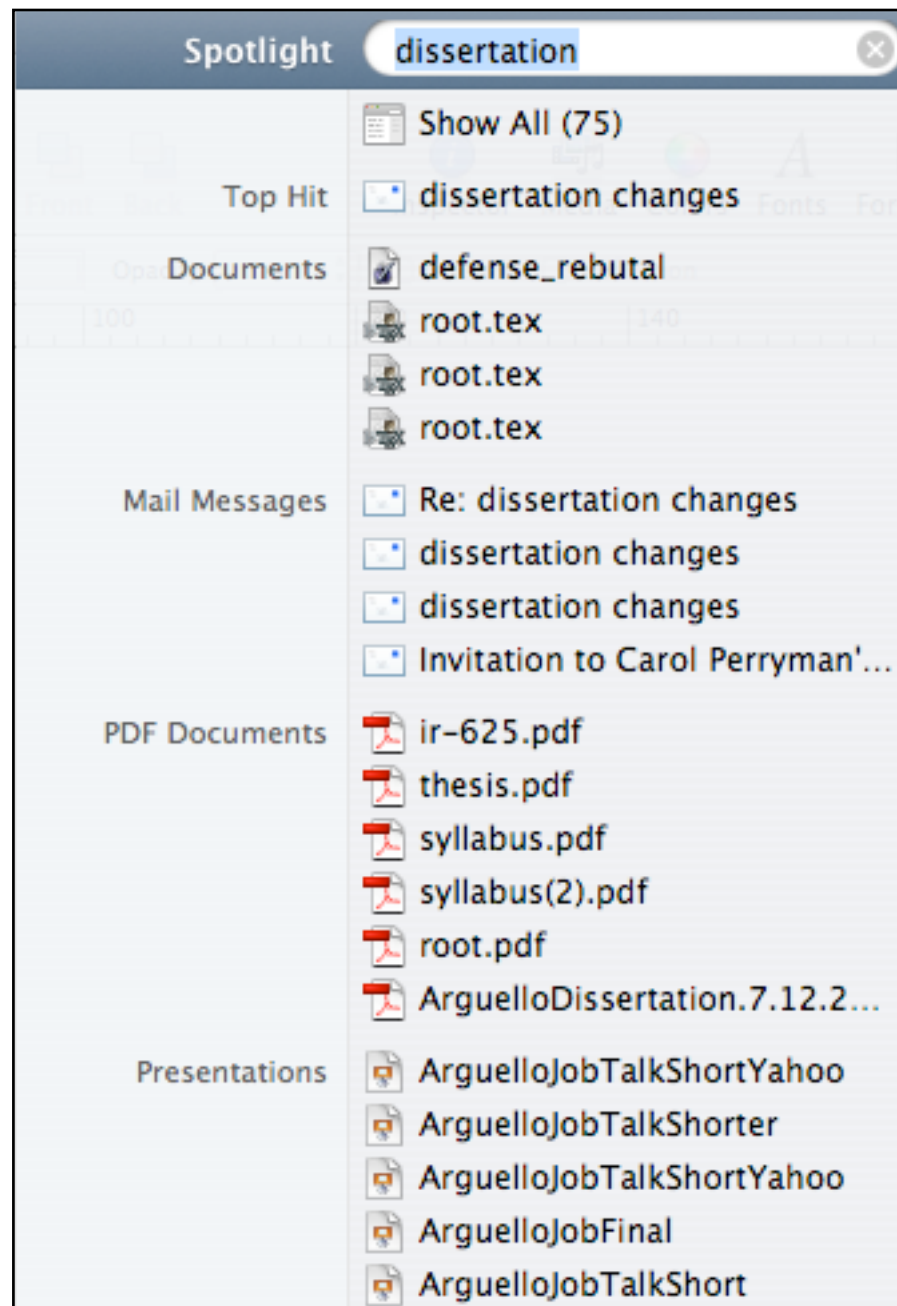


# Search Engines

## desktop search

query

results



corpus



files in my laptop

# Search Engines

## micro-blog search

query

results



**neenjames** Neen James  
Productivity tip: Follow ppl on **Twitter** that inspire, challenge and inform you - delete the clutter!  
4 minutes ago



**mr\_Ostentatious** Jason Pitts  
Took a day off from **twitter** to increase my **productivity** and ended up having a productive day!  
1 hour ago



**adamwiebe** Adam Wiebe  
Social media at work is here. Be wary of what is and is not productive. <http://lnkd.in/DW3z8J>  
3 hours ago



**ViggosDaddy** Gert van der Linde  
A brief look: To tweet, or not to tweet? - How does **Twitter** affect our **productivity**, influence and how informe... <http://tinyurl.com/3wbz3rn>  
6 hours ago



**IncorrectMystic** Raghavender | raGz  
#**productivity** day - So going be off **twitter** and other social networks till work is over :) bye tweeples for a while  
6 hours ago

corpus

twitter



tweets

# Search Engines

## people/profile search

query

results

michael jordan



**Michael Jordan**

Page

12,856,455 people like this.



**Michael Jordan**

Carnegie Mellon



**Michael Jordan**

1 mutual friend



**Michael Jordan**

Page

215,268 people like this.



**Michael Jordan**

Page

225,371 people like this.



**MICHAEL JORDAN**

Page

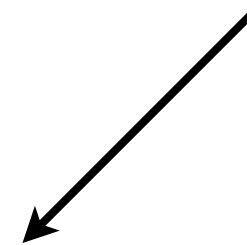
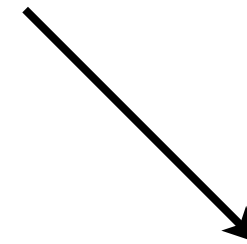
190,013 people like this.



**Michael Jordan**

Page

58,003 people like this.



corpus



profiles

# Information Retrieval Tasks and Applications

digital library search

web search

enterprise search

news search

local business search

image search

video search

(micro-)blog search

community Q&A search

desktop search

question-answering

federated search

social search

expert search

product search

patent search

recommender systems

opinion mining

# The Search Task

## in this course

- Given a query and a corpus, find relevant items

**query:** user's expression of their information need

- ▶ a textual description of what the user wants

**corpus:** a repository of retrievable items

- ▶ a collection of textual documents

**relevance:** satisfaction of the user's information need

- ▶ the document contains information the user wants



# Outline

## Introductions

What is information retrieval (IR)?

What is a search engine?

Why is information retrieval difficult?

How do search engines predict relevance?

How good is a search engine?

# Why is IR Difficult?

- Information retrieval is an **uncertain** process
  - ▶ users don't know what they want
  - ▶ users don't know how to convey what they want
  - ▶ computers can't elicit information like a librarian
  - ▶ computers can't understand natural language text
  - ▶ the search engine can only guess what is relevant
  - ▶ the search engine can only guess if a user is satisfied
  - ▶ over time, we can only guess how users adjust their short- and long-term behavior for the better

# Queries and Relevance

- A query is an impoverished description of the user's information need
- Highly ambiguous to anyone other than the user

# Queries and Relevance

- ▶ soft surroundings
- ▶ trains interlocking dog sheets
- ▶ belly dancing music
- ▶ christian dior large bag
- ▶ best western airport sea tac
- ▶ [www.bajawedding.com](http://www.bajawedding.com)
- ▶ marie selby botanical gardens
- ▶ big chill down coats
- ▶ [www.magichat.co.uk](http://www.magichat.co.uk)
- ▶ marie selby botanical gardens
- ▶ broadstone raquet club
- ▶ seadoo utopia
- ▶ seasons white plains condo
- ▶ [priority.club.com](http://priority.club.com)
- ▶ aircat tools
- ▶ epicurus evil
- ▶ instructions
- ▶ hinds county city of jackson
- ▶ last searches on aol a to z
- ▶ riverbank run

(AOL query-log)

# Queries and Relevance

the input to the system

- Query 435: curbing population growth

what is in the user's head

- **Description:** What measures have been taken worldwide and what countries have been effective in curbing population growth? A relevant document must describe an actual case in which population measures have been taken and their results are known. Reduction measures must have been actively pursued. Passive events such as decease, which involuntarily reduce population, are not relevant.

(from TREC 2005 HARD Track)



# Queries and Relevance

- [illegible]

(from TREC 2005 HARD Track)

# Queries and Relevance

- Query 435: curbing population growth
- Can we imagine a relevant document without all these query terms?

# Queries and Relevance

- Query 435: curbing population growth
- The same concept can be expressed in different ways

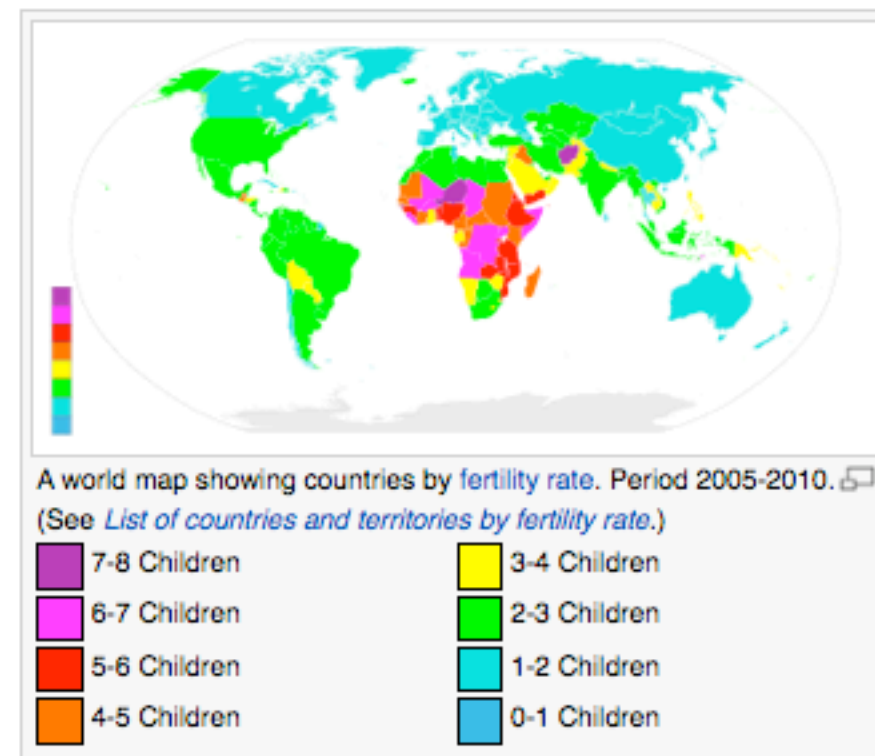
## Human population control

From Wikipedia, the free encyclopedia

**Human population control** is the practice of artificially altering the rate of growth of a human population.

Historically, human population control has been implemented by limiting the population's [birth rate](#), usually by government mandate, and has been undertaken as a response to factors including high or increasing levels of [poverty](#), [environmental concerns](#), [religious reasons](#), and [overpopulation](#). While population control can involve measures that improve people's lives by giving them greater control of their reproduction, some programs have exposed them to exploitation.<sup>[1]</sup>

Worldwide, the population control movement was active throughout the 1960s and 1970s, driving many [reproductive health](#) and [family planning](#) programs. In the 1980s, tension grew between population control advocates and women's health activists who advanced women's [reproductive rights](#) as part of a [human rights](#)-based approach.<sup>[2]</sup> Growing opposition to the narrow population control focus led to a significant change in population control policies in the early 1990s.<sup>[3]</sup>



# Queries and Relevance

- Query 435: curbing population growth
- Can we imagine a non-relevant document with all these query terms?

# Queries and Relevance

- Query 435: curbing population growth
- The query concept can have different “senses”

## Dengue in Philippines taken seriously at one hotel in Clark Philippines

Jul 18, 2010 23:58 EDT



Philippines government department of Health has issued warning of Dengue epidemic in July 2010 which is expected to last until the end of the year.

While most hotels and resorts are slow to take steps to address this health and safety issues, one hotel in Clark Philippines is already well on its way to implementing proactive measures to prevent the spread of Dengue by curbing population growth of mosquito.





# Queries and Relevance

- This is why IR is difficult (and fascinating!)
- Croft, Metzler, & Strohman:

Understanding how people compare text and designing computer algorithms to accurately perform this comparison is at the core of information retrieval.
- IR does not seek a deep “understanding” of the document text
- It uses statistical properties of the text to predict whether a document is relevant to a query
  - ▶ easier and often times sufficient

# Outline

## Introductions

What is information retrieval (IR)?

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# Predicting Relevance

- What types of evidence can we use to predict that a document is relevant to a query?
  - ▶ **query-document evidence:** a property of the query-document pair (e.g., a measure of similarity)
  - ▶ **document evidence:** a property of the document (same for all queries)

# Query-Document Evidence

- Query: bathing a cat

## How to Bathe a Cat

Edited by Kimberly and 107 others

Article

Edit

Discuss

History

Tweet

22

Like

50

Even though they mostly keep themselves clean, most cats need a bath every now and then. Everyone knows that cats hate getting wet. Cats generally keep themselves clean, and therefore should not be bathed any more often than is absolutely necessary. But they sometimes get especially dirty, get bombarded by fleas or ticks, or get into substances that are toxic or otherwise harmful. On such occasions, it is a good idea to bathe your cat. Here's how to keep your feline fresh and lovely as painlessly as possible!



Ads by Google

[Pet Allergy Info](#) Information On The Symptoms And Triggers For Indoor Allergies.  
ZYRTEC.com

### Steps

Edit

- 1 **Decide, whether your cat really needs a bath.** There may be other ways to clean your cat, such as [brushing the cat](#), combing or even rubbing it down with a cloth.
- 2 **Wear appropriate clothing.** Not only is it important to wash your cat but it is important to be safe from any possible scratches, minor or major. A jumper or a long-sleeved shirt must be worn so that your cat has no bare skin to scratch. If you don't have one, you could wear long-sleeved gloves. It is also a good idea to wear clothing that isn't new.
- 3 **Get at least two people involved in washing your cat, especially if your cat is rather strong and can kick and wriggle its way out of your hands.** One person should hold all four legs and hold the cat's jaw so it can't open its mouth to bite you, but be sure you don't hold it really tight so it can't breathe. Hold your cat firmly so it cannot wriggle out from your grip.
- ⋮
- 16 **Reward your cat.** Give him/her their favorite canned food or catnip or treats, and he/she will come to realize that there is a good side to being bathed.



# Query-Document Evidence

- Query: **bathing** a **cat**
- The important query terms occur frequently
- Both terms occur
- Terms occur close together
- Terms occur in the title
- Terms occur in the URL

[www.wikihow.com/bathe-your-cat](http://www.wikihow.com/bathe-your-cat)

- Any other ideas?

## How to Bathe a Cat

Edited by Kimberly and 107 others

Article Edit Discuss History

[Tweet](#) 22 [Like](#) 50

Even though they mostly keep themselves clean, most **cats** need a **bath** every now and then. Everyone knows that **cats** hate getting wet. **Cats** generally keep themselves clean, and therefore should not be **bathed** any more often than is absolutely necessary. But they sometimes get especially dirty, get bombarded by fleas or ticks, or get into substances that are toxic or otherwise harmful. On such occasions, it is a good idea to **bathe** your **cat**. Here's how to keep your feline fresh and lovely as painlessly as possible!

Ads by Google

[Pet Allergy Info](#) Information On The Symptoms And Triggers For Indoor Allergies. ZYRTEC.com

### Steps



1 **Decide, whether your **cat** really needs a **bath**.** There may be other ways to clean your **cat**, such as **brushing the cat**, combing or even rubbing it down with a cloth.

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⋮

16 **Reward your **cat**.** Give him/her their favorite canned food or catnip or treats, and he/she will come to realize that there is a good side to being **bathed**.





# Query-Document Evidence

- Terms occur in hyperlinks pointing to the page

## How to Raise Angora Cats

Edited by Elizabeth Knudsen and 3 others

- 3 Groom the cat regularly.** The angora cats usually have medium length fur, and need to be groomed at least 3-4 times at week. This does not include bathing, you should only **bathe the cat** if it gets specially dirty, or for a show.

- Same language as query
- Other terms semantically related to query-terms (e.g., feline, wash)

## How to Bathe a Cat

Edited by Kimberly and 107 others

Article

Edit

Discuss

History

Tweet 22

Like 50

Even though they mostly keep themselves clean, most **cats** need a **bath** every now and then. Everyone knows that **cats** hate getting wet. **Cats** generally keep themselves clean, and therefore should not be **bathed** any more often than is absolutely necessary. But they sometimes get especially dirty, get bombarded by fleas or ticks, or get into substances that are toxic or otherwise harmful. On such occasions, it is a good idea to **bathe** your **cat**. Here's how to keep your feline fresh and lovely as painlessly as possible!



Ads by Google

**Pet Allergy Info** Information On The Symptoms And Triggers For Indoor Allergies.  
ZYRTEC.com

## Steps

Edit

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- ⋮
- 16 Reward your **cat**.** Give him/her their favorite canned food or catnip or treats, and he/she will come to realize that there is a good side to being **bathed**.



# Query-Document Evidence

- Does not contain “.com”
- Not one of the most popular queries
- Does not contain the term “news”

## How to Bathe a Cat

Edited by Kimberly and 107 others

Article

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Even though they mostly keep themselves clean, most cats need a bath every now and then. Everyone knows that cats hate getting wet. Cats generally keep themselves clean, and therefore should not be bathed any more often than is absolutely necessary. But they sometimes get especially dirty, get bombarded by fleas or ticks, or get into substances that are toxic or otherwise harmful. On such occasions, it is a good idea to bathe your cat. Here's how to keep your feline fresh and lovely as painlessly as possible!



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[ZYRTEC.com](#)

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- ⋮
- 16 **Reward your cat.** Give him/her their favorite canned food or catnip or treats, and he/she will come to realize that there is a good side to being bathed.





# Query-Document Evidence

- We can also use previous user interactions, e.g.:
- The query is similar to other queries associated with clicks on this document
- The document is similar to other documents associated with clicks for this query

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Edit

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- 2 **Wear appropriate clothing.** Not only is it important to wash your cat but it is important to be safe from any possible scratches, minor or major. A jumper or a long-sleeved shirt must be worn so that your cat has no bare skin to scratch. If you don't have one, you could wear long-sleeved gloves. It is also a good idea to wear clothing that isn't new.
- 3 **Get at least two people involved in washing your cat, especially if your cat is rather strong and can kick and wriggle its way out of your hands.** One person should hold all four legs and hold the cat's jaw so it can't open its mouth to bite you, but be sure you don't hold it really tight so it can't breathe. Hold your cat firmly so it cannot wriggle out from your grip.
- ⋮
- 16 **Reward your cat.** Give him/her their favorite canned food or catnip or treats, and he/she will come to realize that there is a good side to being bathed.



# Document Evidence

- Lots of in-links (endorsements)
- Non-spam properties:
  - ▶ grammatical sentences
  - ▶ no profanity
- Has good formatting
- Anything other ideas?

## How to Bathe a Cat

Edited by Kimberly and 107 others

Article

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Even though they mostly keep themselves clean, most cats need a bath every now and then. Everyone knows that cats hate getting wet. Cats generally keep themselves clean, and therefore should not be bathed any more often than is absolutely necessary. But they sometimes get especially dirty, get bombarded by fleas or ticks, or get into substances that are toxic or otherwise harmful. On such occasions, it is a good idea to bathe your cat. Here's how to keep your feline fresh and lovely as painlessly as possible!



Ads by Google

[Pet Allergy Info](#) Information On The Symptoms And Triggers For Indoor Allergies.  
ZYRTEC.com

### Steps

Edit

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# Document Evidence

- Author attributes
- Peer-reviewed by many
- Reading-level appropriate for user community
- Has pictures
- Recently modified (fresh)
- Normal length
- From domain with other high-quality documents

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# Predicting Relevance

- IR does not require a deep “understanding” of information
- We can get by using shallow sources of evidence, which can be generated from the query-document pair or just the document itself.

# Outline

## Introductions

What is information retrieval (IR)?

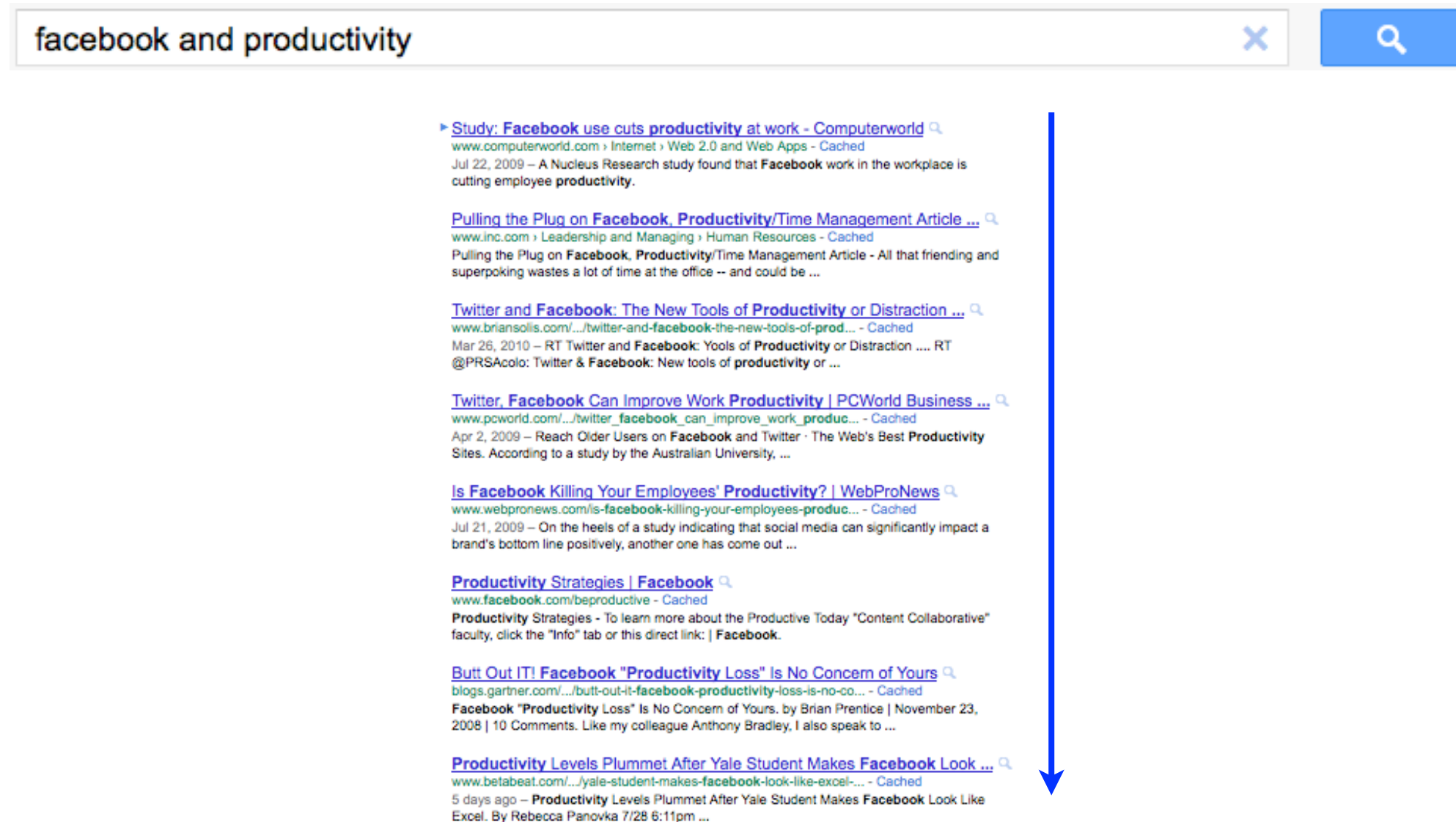
What is a search engine?

Why is information retrieval difficult?

How do search engines predict relevance?

How good is a search engine?

# The Search Task



- **Output:** a ranking of items in descending order of predicted relevance (simplifies the task)
- **Assumption:** the user scans the results from top to bottom and stops when he/she is satisfied or gives up

# Evaluating a Ranking

facebook and productivity

Study: Facebook use cuts productivity at work - Computerworld  
www.computerworld.com > Internet > Web 2.0 and Web Apps - Cached  
Jul 22, 2009 - A Nucleus Research study found that Facebook work in the workplace is cutting employee productivity.

Pulling the Plug on Facebook, Productivity/Time Management Article ...  
www.inc.com > Leadership and Managing > Human Resources - Cached  
Pulling the Plug on Facebook, Productivity/Time Management Article - All that friending and superpoking wastes a lot of time at the office -- and could be ...

Twitter and Facebook: The New Tools of Productivity or Distraction ...  
www.briansolis.com/.../twitter-and-facebook-the-new-tools-of-prod... - Cached  
Mar 26, 2010 - RT Twitter and Facebook: Yools of Productivity or Distraction .... RT @PRSAcolo: Twitter & Facebook: New tools of productivity or ...

Twitter, Facebook Can Improve Work Productivity | PCWorld Business ...  
www.pcworld.com/.../twitter\_facebook\_can\_improve\_work\_produc... - Cached  
Apr 2, 2009 - Reach Older Users on Facebook and Twitter · The Web's Best Productivity Sites. According to a study by the Australian University, ...

Is Facebook Killing Your Employees' Productivity? | WebProNews  
www.webpronews.com/is-facebook-killing-your-employees-produc... - Cached  
Jul 21, 2009 - On the heels of a study indicating that social media can significantly impact a brand's bottom line positively, another one has come out ...

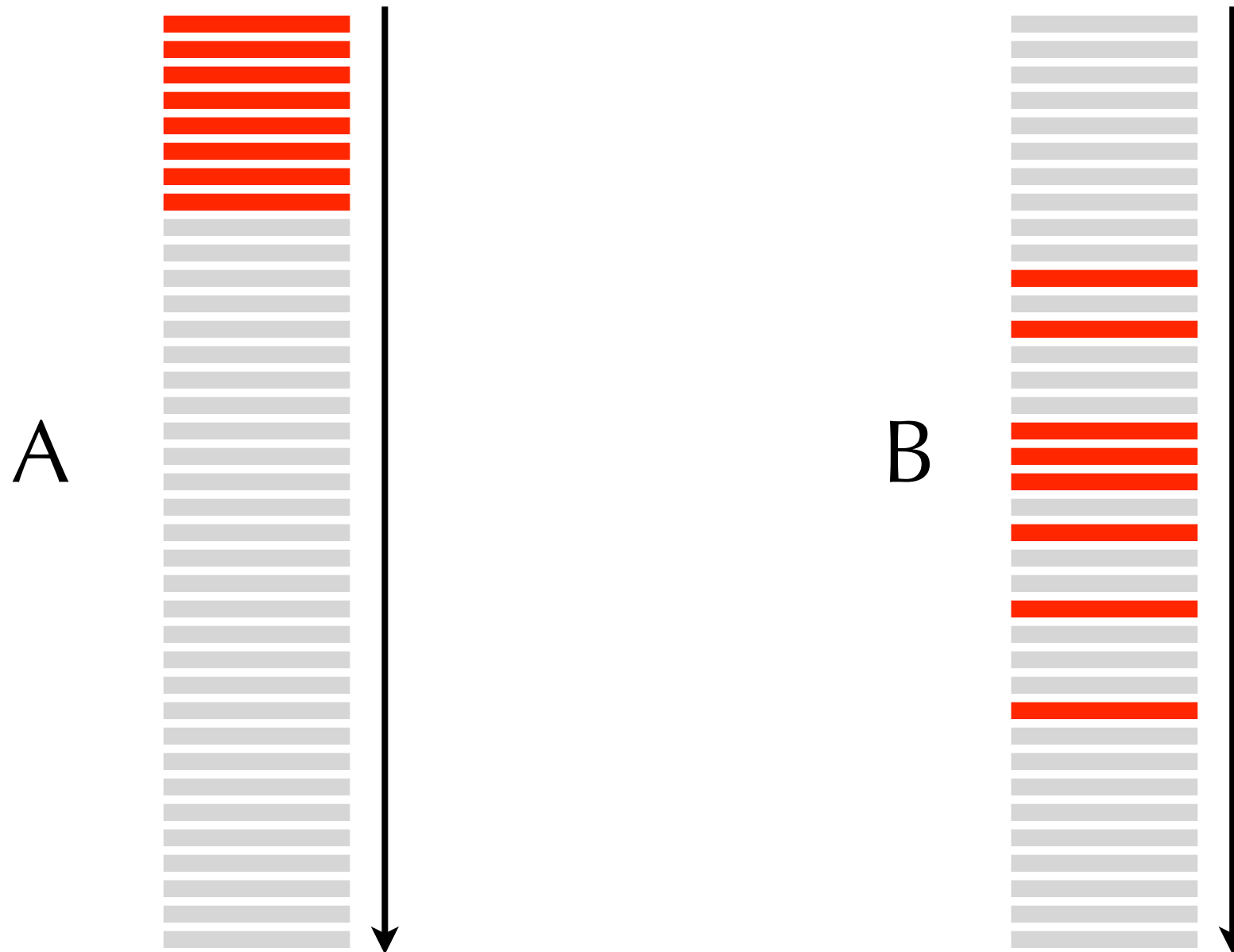
Productivity Strategies | Facebook  
www.facebook.com/beproductive - Cached  
Productivity Strategies - To learn more about the Productive Today "Content Collaborative" faculty, click the "Info" tab or this direct link: | Facebook.

Butt Out IT! Facebook "Productivity Loss" Is No Concern of Yours  
blogs.gartner.com/.../butt-out-it-facebook-productivity-loss-is-no-co... - Cached  
Facebook "Productivity Loss" Is No Concern of Yours. by Brian Prentice | November 23, 2008 | 10 Comments. Like my colleague Anthony Bradley, I also speak to ...

Productivity Levels Plummet After Yale Student Makes Facebook Look ...  
www.betabeat.com/.../yale-student-makes-facebook-look-like-excel... - Cached  
5 days ago - Productivity Levels Plummet After Yale Student Makes Facebook Look Like Excel. By Rebecca Panovka 7/28 6:11pm ...

- So, how good is a particular ranking?
- Suppose we know which documents are truly relevant to the query...

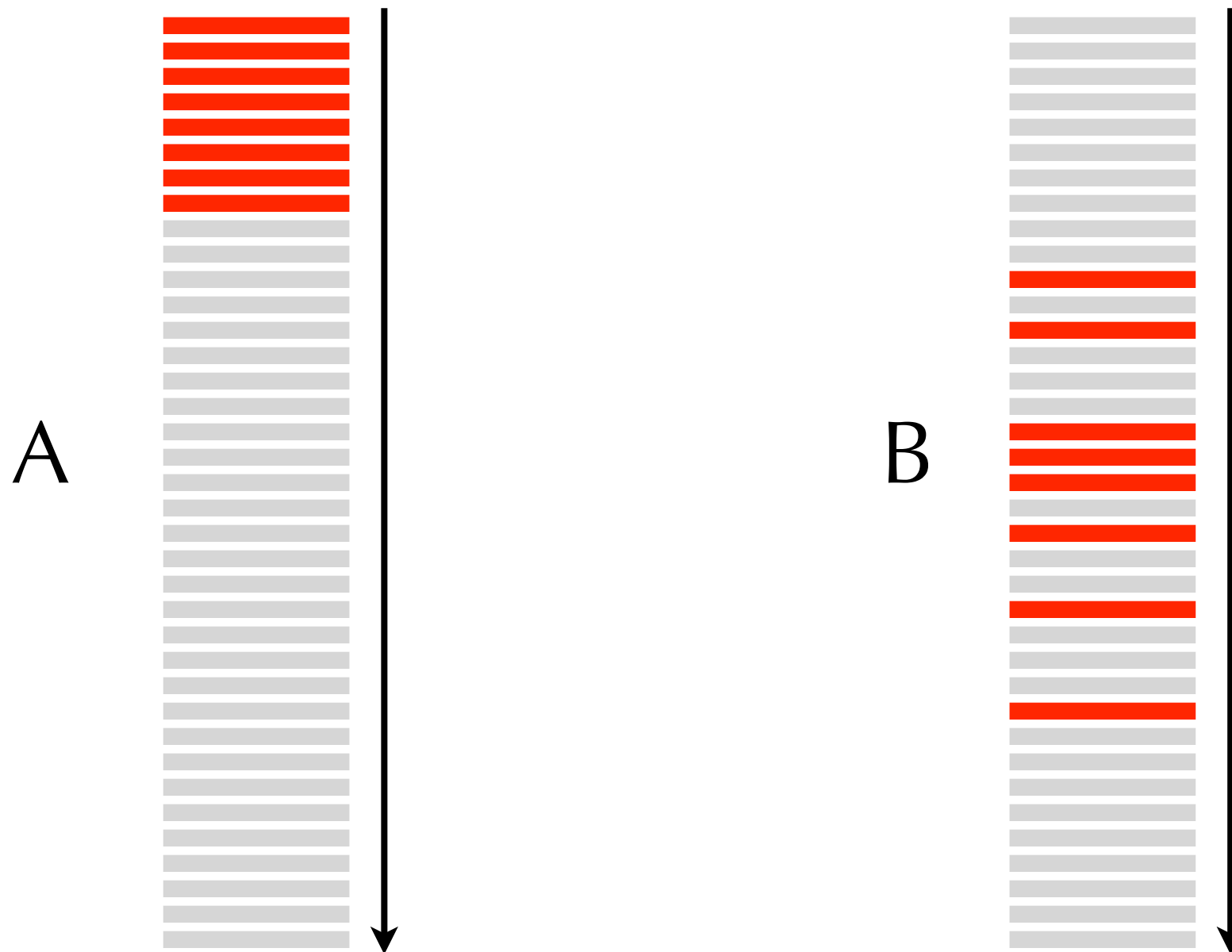
# Evaluating a Ranking



- Which ranking is better?

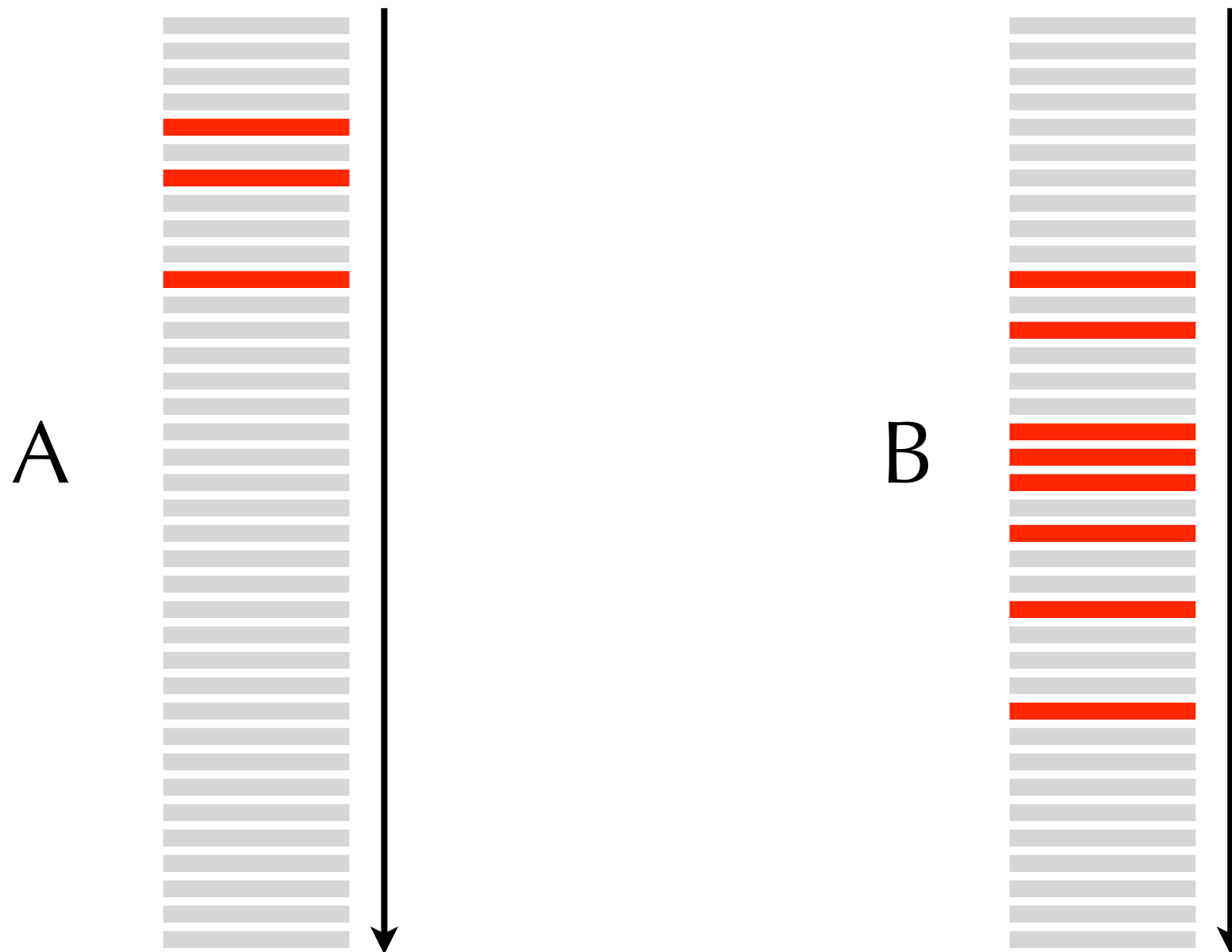


# Evaluating a Ranking



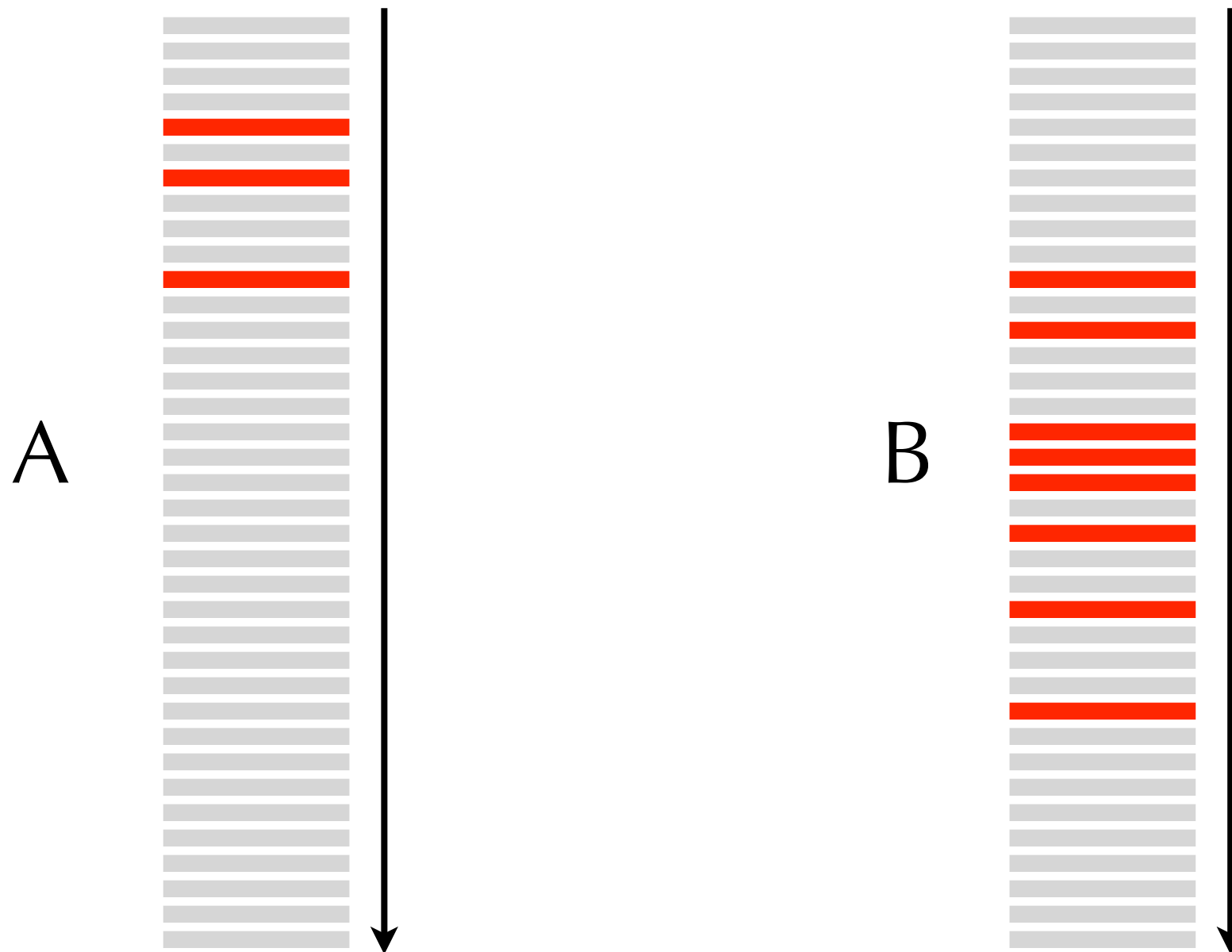
- In general, a ranking with all the relevant documents at the top is best (A is better than B)

# Evaluating a Ranking



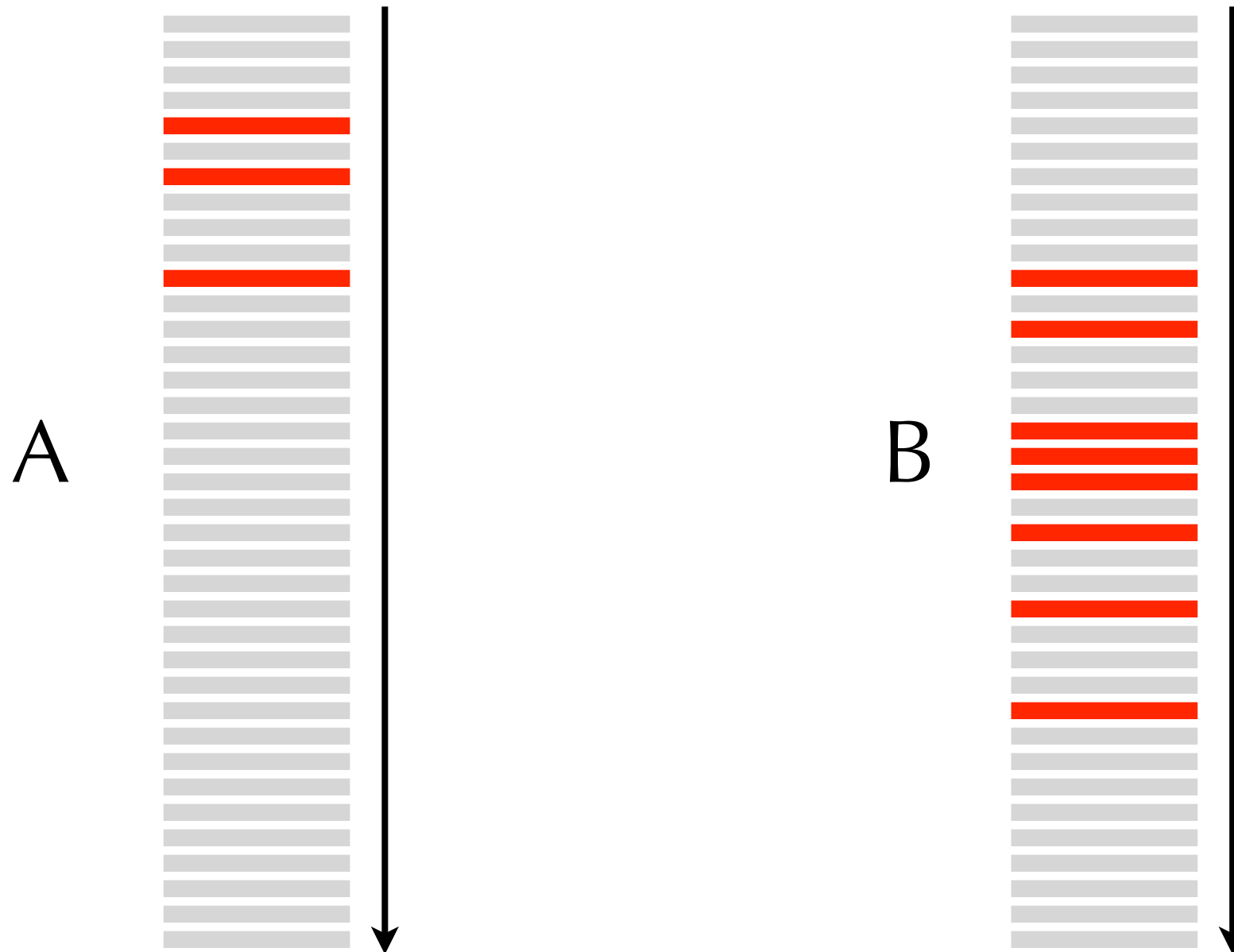
- Which ranking is better?

# Evaluating a Ranking



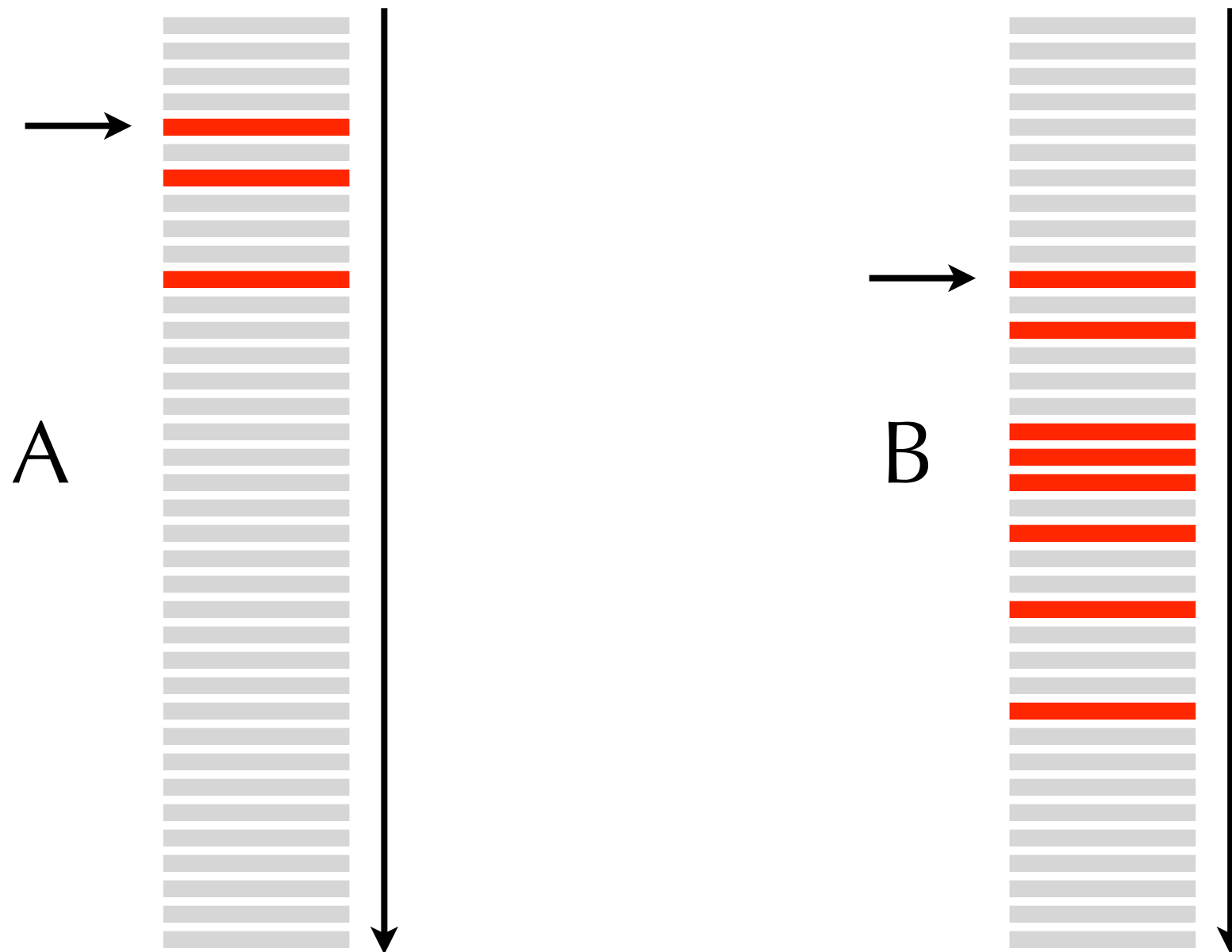
- Oftentimes the (relative) quality of a ranking is unclear and depends on the task

# Evaluating a Ranking



- Web search: ???????

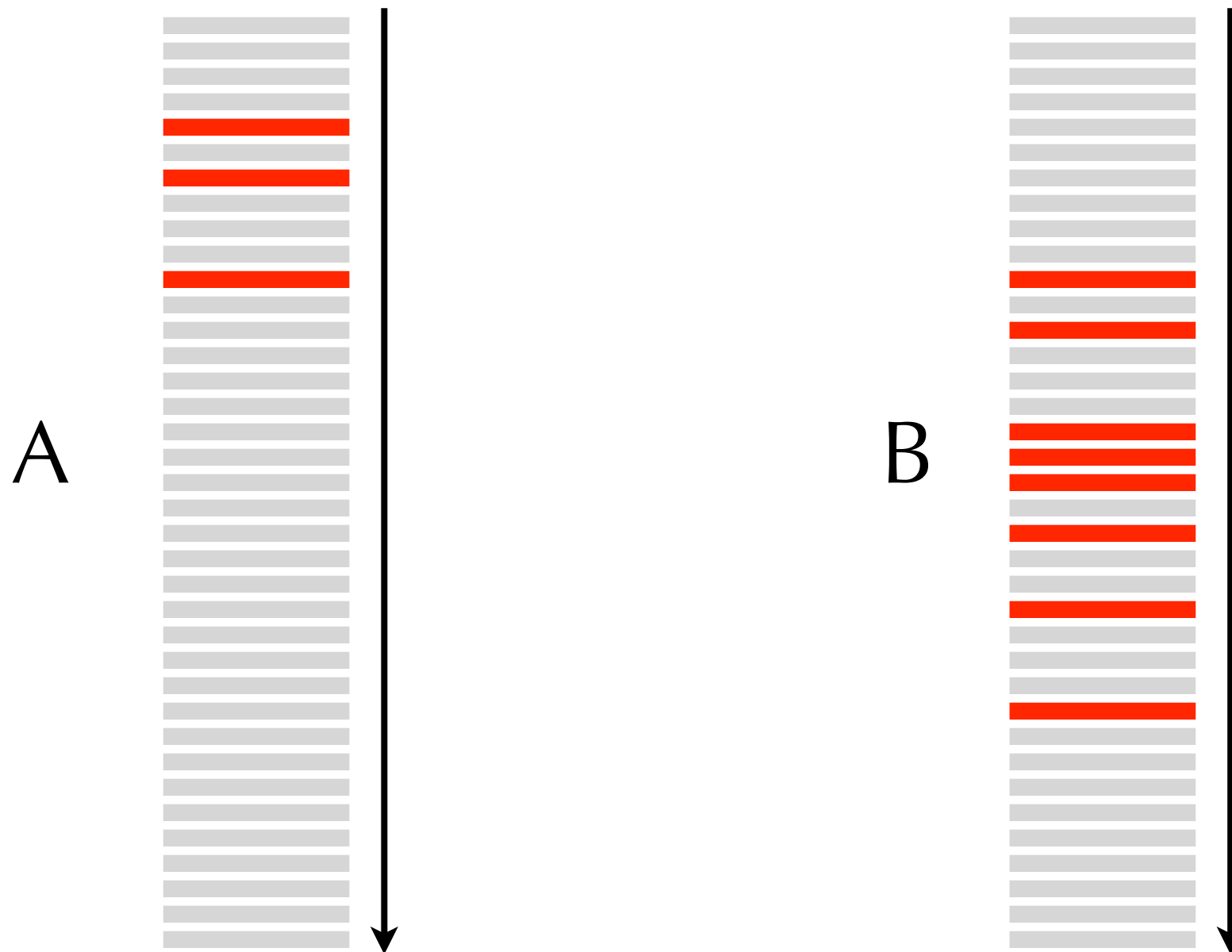
# Evaluating a Ranking



- **Web search:** A is better than B
- Many documents (redundantly) satisfy the user; the user doesn't want all of them; the higher the first relevant document, the better

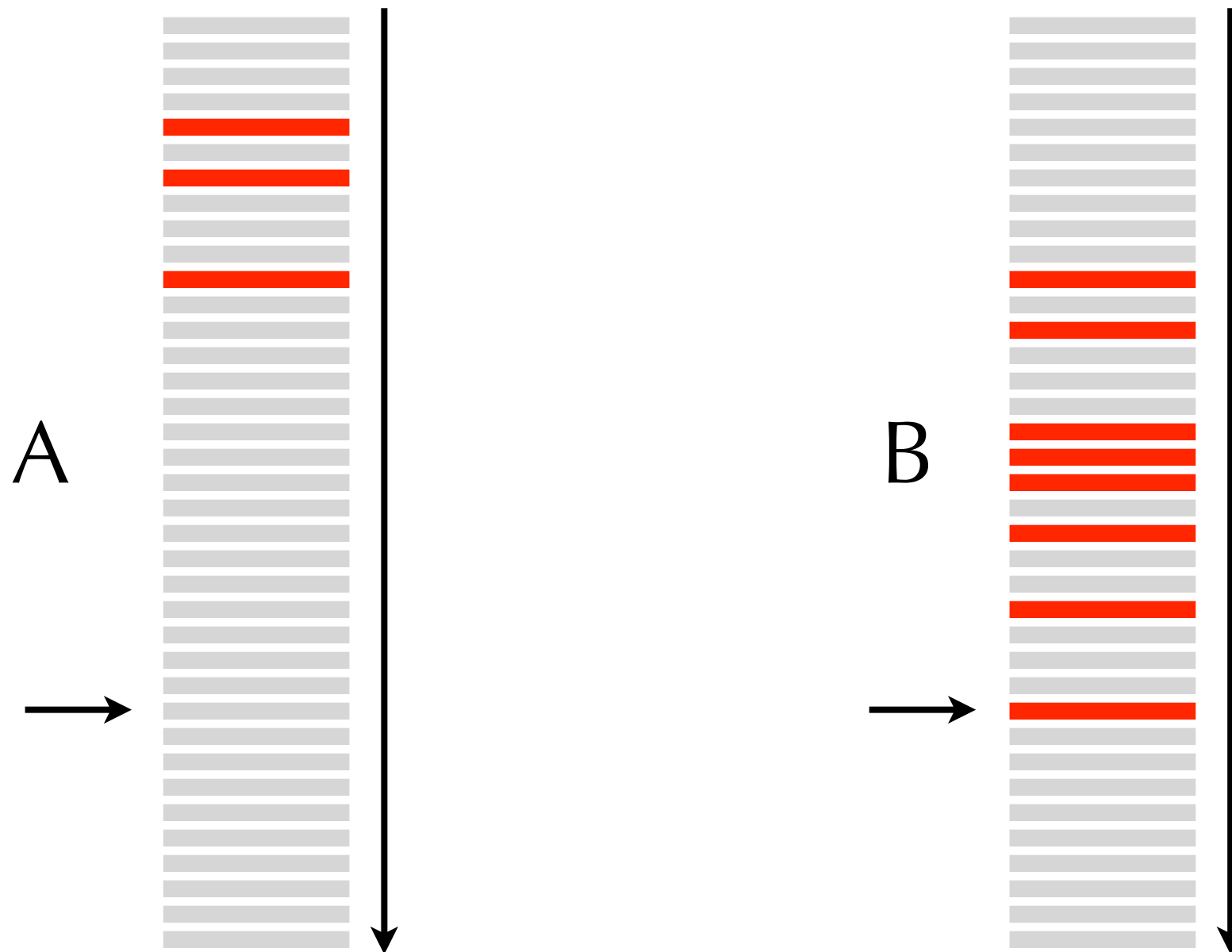


# Evaluating a Ranking



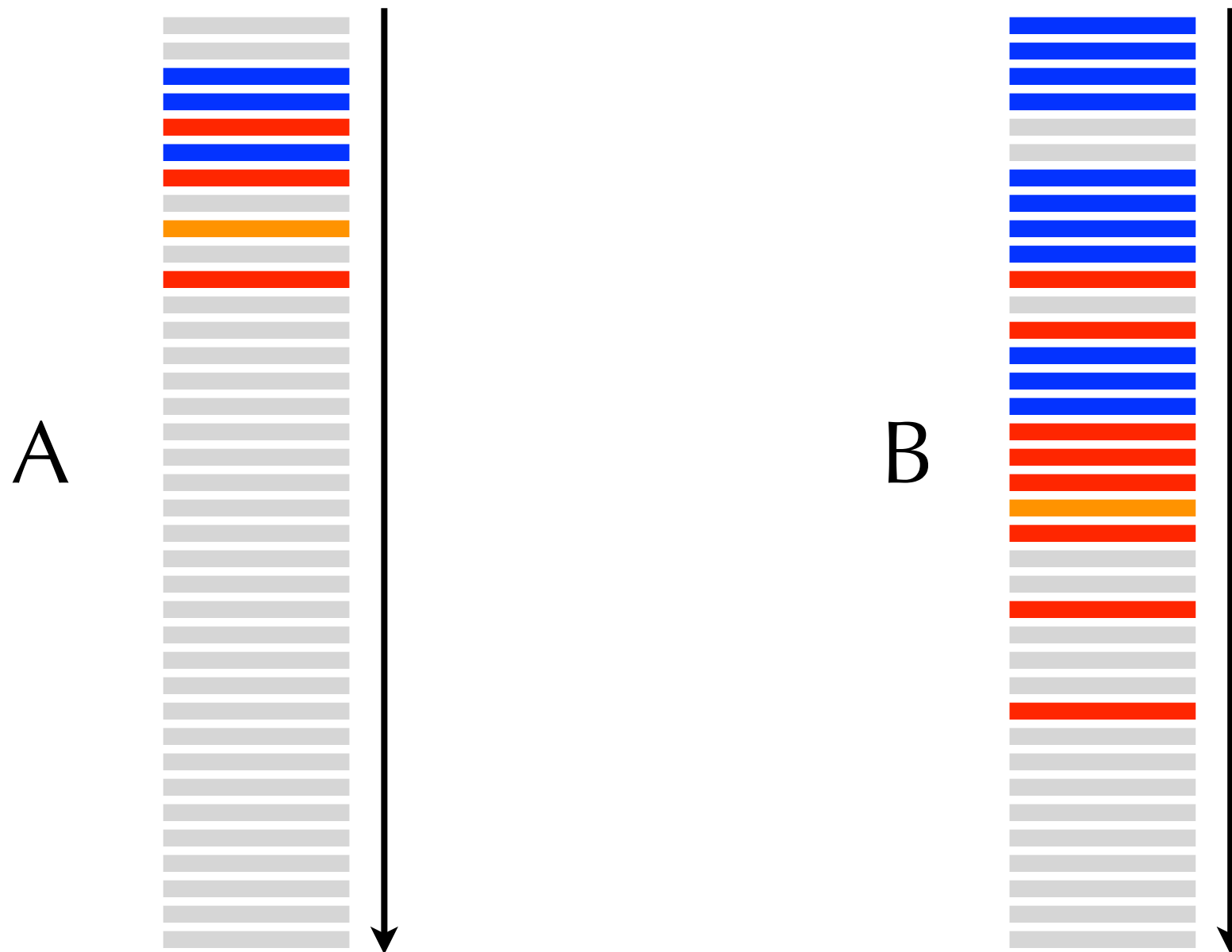
- Patent search: ???????

# Evaluating a Ranking



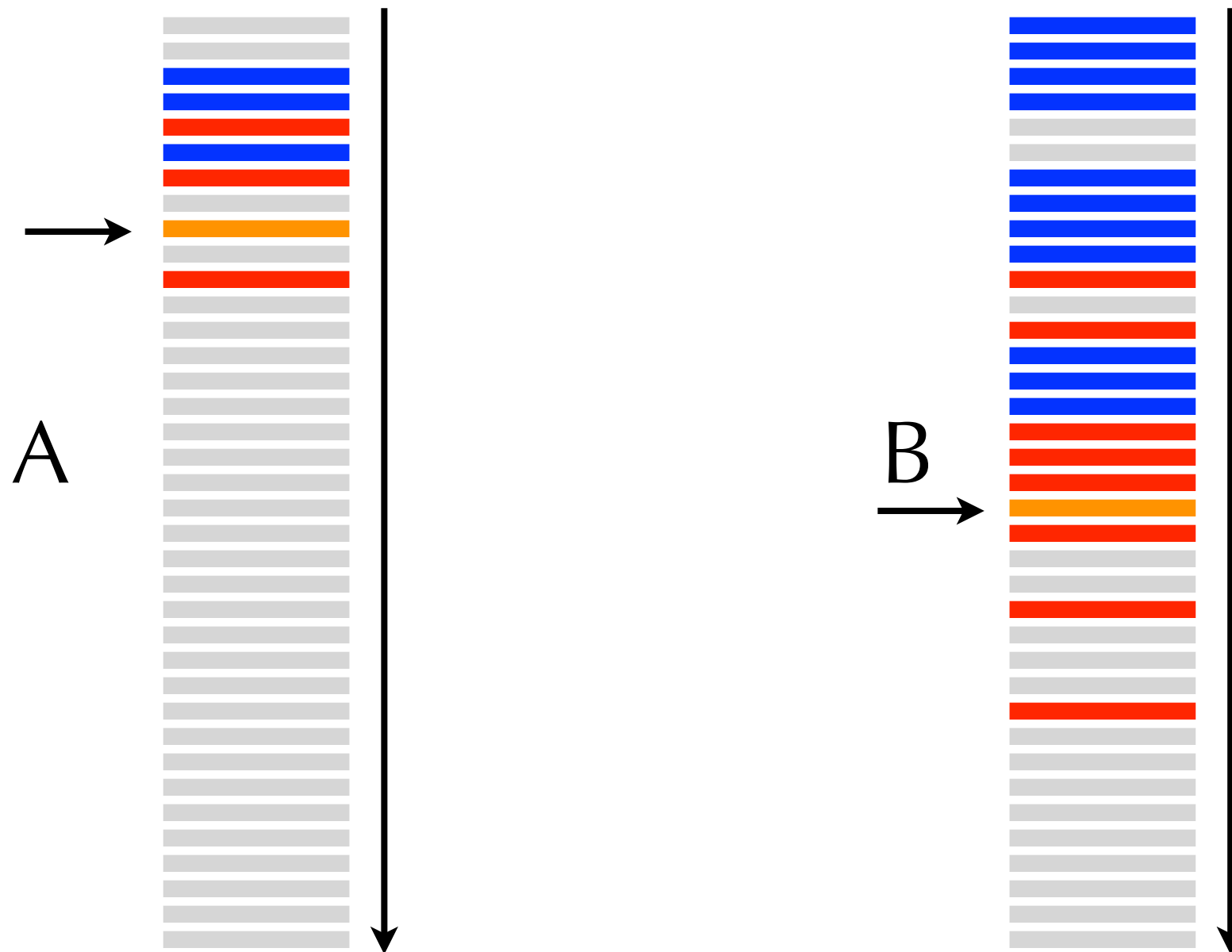
- Patent search: B is better than A
- User wants to see everything in the corpus that is related to the query (high cost in missing something)

# Evaluating a Ranking



- Exploratory or multi-faceted search: ??????

# Evaluating a Ranking



- **Exploratory or multi-faceted search:** A is better than B
- Satisfying the information need requires information found in different documents

# Evaluating a Ranking

## evaluation metrics

- Given a ranking with known relevant/non-relevant documents, an **evaluation metric** outputs a quality score
- Many, many metrics
- Different metrics make different assumptions
- Choosing the “right one” requires understanding the task
- Often, we use several (sanity check)



# Summary

- The goal of information retrieval is to match information-seekers with the information they seek.
- IR involves analysis, organization, storage, and retrieval
- There are many types of search engines
- There is uncertainty at every step of the search process
- Simple heuristics don't work, so IR systems make predictions about relevance!
- IR systems use “superficial” evidence to make predictions
- Users expect different things, depending on the task
- Evaluation requires understanding the user community.
- My goal is convince you that IR is a fascinating science