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# Information retrieval with elasticsearch

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# About

## Previously:

- Microsoft Cambridge
- Bing Social Search
- FAST

## Now: Spindle

Using ES since June 2011  
(Almost) all data in ES

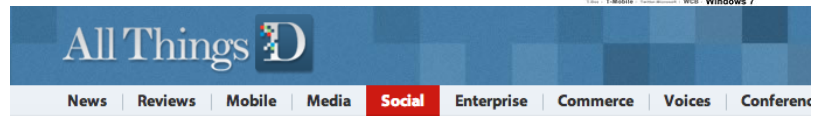
### Bing vs. Google: The Conquest of Twitter

By Josh Tyrangiel / San Francisco | Wednesday, Oct. 21, 2009

Like 0 Tweet 0 +1 0 Share

Updated: Oct. 22, 2009

Microsoft revealed a nice little coup in its dual quests to make search more dynamic and crawl its way into Google's monolithic grill. At the Web 2.0 conference



Walt Mossberg - Annual Laptop Guide: Making Sense of All the New Flavors Follow @ATDreviews



Mike Isaac

ethics statement | bio | e-mail | RSS | Subscribe | 51k | Follow @Mikelsaac

### With Spindle, Ex-Microsoft Engineers Rethink the Social Discovery App

AUGUST 9, 2012 AT 12:00 PM PT

Tweet Like +1 Share Share Print

There's the risk decade the end Web 2.0 so. It's gaining

#### FUNDINGS & EXITS

Comment 3  
Like 197  
Tweet 543  
Share 69  
+1 11

### Latest Spindle For iOS Hits The Store: Discovery That's Great For Businesses And Consumers, Raises \$2.3M

DREW OLANOFF

Thursday, November 15th, 2012

3 Comments



Spindle, an app that aids with social discovery, has just launched its latest version for iOS. It not only helps you explore the areas around you, it will be a great place for businesses to promote themselves and where they live on social networks like Twitter.

The company has also raised a \$2.3 million round of funding from an impressive list of investors: Polaris Ventures, Greylock Partners, Lerer Ventures, SV Angel, Atlas Ventures, Broad Beach Ventures, Project 11, Ray Ozzie and Raman Narayanan.

# Why *this* talk?

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"Hello  
world"

Config  
reference

---

# Why *this* talk?

---

"Hello  
world"



Config  
reference

---

# Why *this* talk?

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- To use elasticsearch effectively, you must understand the concepts of *information retrieval*
    - "Why can't I just do a regular expression search over my document content?"
    - "Why can't I find the phrase 'to be or not to be'?"
    - "Why was this document returned in my search results? It doesn't have the words from my query!"
    - "Why was this document scored higher than that document?"
  - Content based on [\*Introduction to Information Retrieval\*](#) by Manning et al.
-

# Databases, by question

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- Relational databases
    - Adept at answering "What are the names of all employees in the finance department earning over \$40,000 per year?"
    - Implementations include Oracle, MySQL
  - Key-value stores
    - "What is user 123's profile image?"
    - Cassandra, Riak, Dynamo
  - Graph databases
    - "Which friends of friends do Steve and Alex have in common?"
    - Neo4j, FlockDB
-

# ***Information retrieval engines***

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What is Google adept at answering?

*Information retrieval (IR) is finding documents of an unstructured nature that satisfy an information need from within a large collection. (Manning)*

Implementations: Lucene (elasticsearch, Solr), FAST ESP, Endeca, Sphinx...

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# Finding a place






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*Information retrieval (IR) is finding documents of an unstructured nature that satisfy an information need from within a large collection.*

AT&T 13:59

Search: craigy's in maine [X] Cancel

Results for "craigy's in maine" [Flag]

-  **Craigie On Main**  
853 Main St, Cambridge, MA 02139  
New American Restaurant **2.58 mi**
-  **Craigie Arms**  
26 Concord Ave, Cambridge, MA 02...  
**4.24 mi**
-  **7 Craigie Circle**  
7 Craigie Circle, Cambridge, MA 02138  
Community & Government **4.3 mi**
-  **Craigie Realty Trust**  
20 Winchester St, Brookline, MA 02446  
Business Management **4.0 mi**
-  **Craigie Street Associates**  
25 Flanders Rd Ste 2, Belmont, MA...  
Contractor **6.17 mi**

Ma...



# Finding something to do tonight

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*Information retrieval (IR) is finding documents of an unstructured nature that satisfy an information need from within a large collection.*

**Top Results**

Within 1 mile of Downtown Boston

**The Liberty Hotel** ★ 0.22 mi  
Hotel, Restaurant

**@LibertyHotel**  
Join us tonight for our Summer Series Beer Festival. Selections from Harpoon Brewery and Island Creek Oysters. 6-8pm in The Yard.  
5 minutes ago

**The Barking Crab** 0.41 mi  
Seafood Restaurant, Bar

**The Barking Crab**  
GIF. Let's see what's on 'tap' for today...

# The IR perspective

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Is Harvard a valid result for the query "universities in Boston"?

*Traditional*: "the user knows *precisely* what he wants and how that's represented; I must do *exactly* what he says"

*IR*: "the user wants to find out about something and has given me a *hint* about what it is; I must be *helpful*"

# What makes IR engines different?

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*Information need:* which of Shakespeare's plays mention Brutus and Caesar but not Calpurnia?

<i>MySQL query</i>	<i>elasticsearch query</i>
<code>select name from plays where (text like '%Brutus%') and (text like '%Caesar%') and not (text like '%Calpurnia%')</code>	<code>{"bool": {"must": [{"text": {"text": "Brutus"}}, {"text": {"text": "Caesar"}}], "must_not": [{"text": {"text": "Calpurnia"}}]}}</code>

Why ES over SQL? IR engines provide:

- Efficient access to huge collections: no table scans
  - Flexible matching: "Romans" within 5 words of "countrymen"
  - Ranked retrieval: best matches first
-

# Efficient access to huge collections

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*Information need:* which of Shakespeare's plays mention Brutus and Caesar but not Calpurnia?

We can *index* the plays. Collect all *terms* (words, for now). For each *document*, record whether it contains each possible *term*.

*Query:* Brutus AND Caesar AND NOT Calpurnia

	Antony and Cleopatra	Julius Caesar	The Tempest	Hamlet	Othello	Macbeth	...
Antony	1	1	0	0	0	1	
→ Brutus	1	1	0	1	0	0	
→ Caesar	1	1	0	1	1	1	
→ Calpurnia	0	1	0	0	0	0	
Cleopatra	1	0	0	0	0	0	
mercy	1	0	1	1	1	1	
worser	1	0	1	1	1	0	
...							

► **Figure 1.1** A term-document incidence matrix. Matrix element  $(t, d)$  is 1 if the play in column  $d$  contains the word in row  $t$ , and is 0 otherwise.

110100... AND 110111... AND NOT 010000... = 100100...

# The Boolean retrieval model

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- A *document* is a set of *terms* (words, for now)
- *Query*: a Boolean expression of terms
  - Document  $d$  matches  $t$  iff term  $t$  is in  $d$
  - Document  $d$  matches  $t1$  AND  $t2$  iff  $t1$  and  $t2$  are in  $d$
  - Document  $d$  matches  $t1$  OR  $t2$  iff  $t1$  or  $t2$  are in  $d$
  - Document  $d$  matches NOT  $t$  iff  $d$  does not contain  $t$
- Match  $\geq 2$  of 3:  $(a$  AND  $b)$  OR  $(b$  AND  $c)$  OR  $(a$  AND  $c)$

<i>document</i>	<i>query</i>	<i>matched?</i>
Friends, Romans, countrymen.	Romans AND Americans	no
The quick brown fox jumps over the lazy dog	(quick AND brown) AND (fox OR pig)	yes
Texas with a dollar sign	(texas AND dollar) OR (dollar AND sign) OR (texas AND sign)	yes



# The story so far

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*Information retrieval (IR) is finding documents of an unstructured nature that satisfy an information need from within a large collection.*

Users have *information needs* rendered as *queries*

The *Boolean model* provides simple, unranked matching

We can implement the Boolean model using a *postings list*

IR engines provide:

- ✓ Efficient access to large collections
  - Flexible matching
  - Ranked retrieval
-

# Flexible matching

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How did this match?

(We said *terms* are words, and we're just matching terms, but this top result doesn't share any words with the query!)

The screenshot shows a mobile search interface. At the top, the status bar displays 'AT&T', signal strength, Wi-Fi, and the time '13:59'. Below the status bar is a search bar containing the text 'craigy's in maine' with a magnifying glass icon on the left and a close button (X) on the right. To the right of the search bar is a 'Cancel' button. Below the search bar, the text 'Results for "craigy's in maine"' is displayed. The results are listed in a vertical scrollable view. The top result is 'Craigie On Main', which includes a logo of a pig with the text 'CRAIGIE ON MAIN', the address '853 Main St, Cambridge, MA 02139', the category 'New American Restaurant', and a distance of '2.58 mi'. The second result is 'Craigie Arms', with a location pin icon, the address '26 Concord Ave, Cambridge, MA 02...', and a distance of '4.24 mi'. The third result is '7 Craigie Circle', with a photo of a building, the address '7 Craigie Circle, Cambridge, MA 02138', the category 'Community & Government', and a distance of '4.3 mi'. The fourth result is 'Craigie Realty Trust', with a location pin icon, the address '20 Winchester St, Brookline, MA 02446', the category 'Business Management', and a distance of '4.0 mi'. The fifth result is 'Craigie Street Associates', with a location pin icon, the address '25 Flanders Rd Ste 2, Belmont, MA...', the category 'Contractor', and a distance of '6.17 mi'. The bottom of the screenshot shows the start of another result, 'Maine', which is partially cut off.



# Flexible matching

How did this match?

<i>string</i>	<i>terms (after analysis)</i>
craigy's in maine	<craigi> <main>
Craigie On Main	<craigi> <main>

Goal: since we're just matching terms, use clever term choices to fine-tune matching

The screenshot shows a mobile search interface. At the top, the status bar displays 'AT&T', signal strength, Wi-Fi, and the time '13:59'. Below the status bar is a search bar containing the text 'craigy's in maine' with a magnifying glass icon on the left and a close button (X) on the right. To the right of the search bar is a 'Cancel' button. Below the search bar, the text 'Results for "craigy's in maine"' is displayed. The results are listed in a vertical scrollable view. Each result includes an icon, a title, an address, a category, and a distance. The first result is 'Craigie On Main' with a pig icon, address '853 Main St, Cambridge, MA 02139', category 'New American Restaurant', and distance '2.58 mi'. The second result is 'Craigie Arms' with a location pin icon, address '26 Concord Ave, Cambridge, MA 02...', category 'Business Management', and distance '4.24 mi'. The third result is '7 Craigie Circle' with a building icon, address '7 Craigie Circle, Cambridge, MA 02138', category 'Community & Government', and distance '4.3 mi'. The fourth result is 'Craigie Realty Trust' with a location pin icon, address '20 Winchester St, Brookline, MA 02446', category 'Business Management', and distance '4.0 mi'. The fifth result is 'Craigie Street Associates' with a location pin icon, address '25 Flanders Rd Ste 2, Belmont, MA...', category 'Contractor', and distance '6.17 mi'. The bottom of the screenshot shows the start of another result 'Maine'.

# Analysis: from strings to terms

---

input

**(document)** ...Friends, Romans,  
countrymen, lend me your ears...

**(query)** roman countryman  
lending an ear

tokenization

tokens

Friends Romans countrymen  
lend me your ears

roman countryman  
lending an ear

linguistic processing &  
normalization  
(Lucene: token filters)

terms

friend roman countryman  
lend me your ear

roman countryman  
lend ear

match!

# Tokenizing English text

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Goal: break a string into *tokens* (so we can later *filter* those tokens to create *terms*)

Mr. O'Neill thinks that Hewlett-Packard's www.autonomy.com acquisition "didn't go splendidly."

Whitespace tokenizer creates tokens from adjacent sequences of non-whitespace characters ([try it](#))

Mr.	O'Neill	thinks	that	Hewlett-Packard's	www. autonomy. com	acquisition	"didn't
go	splendidly."						

Letter tokenizer divides text at non-letters (creating maximal strings of adjacent letters) ([try it](#))

Mr	O	Neill	thinks	that	Hewlett	Packard	s
www	autonomy	com	acquisition	didn	t	go	splendidly

Standard tokenizer uses a grammar that implements Unicode Text Segmentation and recognizes URLs ([try it](#))

Mr	O'Neill	thinks	that	Hewlett	Packard's	www. autonomy. com	acquisition
didn't	go	splendidly					

# Token filters: from tokens to terms

---

Is tokenization sufficient? Unlikely: consider "iPhone 5", "IPhone 5", "Iphone 5", "iphone 5"

Goal: normalize tokens so that terms from document match terms from query

<i>input token</i>	<u><i>after lowercase</i></u>	<i>after English possessive</i>	<i>after whitespace trimming</i>	<i>after trim, lowercase, possessive</i>
< IBM's>	< ibm's>	< IBM>	<IBM's>	<ibm>

# Token filters: stemming

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- "bank holiday", "bank holidays", "banking holiday", and "banking holidays" all refer to the same concept
- A query for any of those phrases should match a document with any of those phrases
- *Stemming* normalizes words by removing inflections

<i>input tokens</i>	<u><i>after Porter stemmer</i></u>
<bank> <holiday>	<bank> <holidai>
<banks> <holidays>	<bank> <holidai>
<banking> <holiday>	<bank> <holidai>
<banking> <holidays>	<bank> <holidai>

"Why was this document returned in my search results? It doesn't have the words from my query!"

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# Token filters: omitting stopwords

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- Every document contains "a", "an", "of", "the"
- Generally not useful to store *stop words*, so we omit

<i>input tokens</i>	<u><i>after stop word filter</i></u>
<the> <library> <is> <closing> <at> <10>	<library> <closing> <10>
<the> <iphone> <5> <will> <be> <available> <at> <6> <in> <the> <evening>	<iphone> <5> <available> <6> <evening>
<to> <be> <or> <not> <to> <be>	

"Why can't I find the phrase 'to be or not to be'?"

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# When all you have is a postings list, everything looks like term matching

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<i>input tokens</i>	<u><i>after phonetic filter (nysiis)</i></u>
<Jeff> <Lupien>	<JAF> <LAPAN>
<Jeff> <Lupeen>	<JAF> <LAPAN>
<Jefe> <Lupean>	<JAF> <LAPAN>
<Jefe> <Loupeam>	<JAF> <LAPAN>

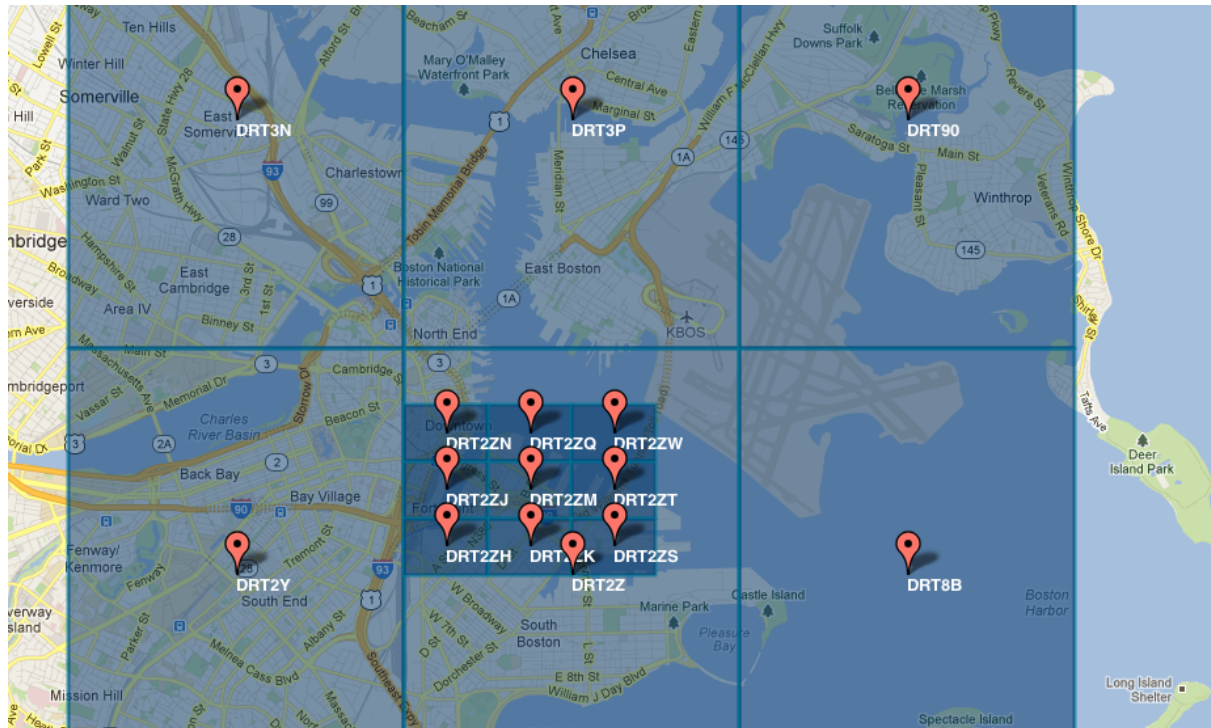
<i>input tokens</i>	<u><i>after shingle (no unigrams) filter</i></u>
<The> <quick> <brown> <fox> <jumped> <over> <the> <dog>	<The quick> <quick brown> <brown fox> <fox jumped> <jumped over> <over the> <the dog>

<i>input string</i>	<u><i>after keyword analysis (or not_analyzed)</i></u>
The quick brown fox jumps over the lazy dog.	<The quick brown fox jumps over the lazy dog.>

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# Geospatial search: geohash terms

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Wikipedia: Geohash is "a hierarchical spatial data structure which subdivides space into buckets of grid shape."

elasticsearch: [geo\\_shape](#) filter



# The story so far

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*Analysis* converts *documents* to *terms*:

- *tokenizers* map a string to a sequence of *tokens*
- *token filters* transform a sequence of tokens

Thinking with terms: searches just traverse the postings list, so cast your problems as term matching

IR engines provide:

- √ Efficient access to large collections
  - √ Flexible matching
  - Ranked retrieval
-

# Ranked retrieval

---

**Top Results**


Within 1 mile of Downtown Boston

**The Liberty Hotel** ★ 0.22 mi  
Hotel, Restaurant

**@LibertyHotel**  
Join us tonight for our Summer Series Beer Festival. Selections from Harpoon Brewery and Island Creek Oysters. 6-8pm in The Yard.  
5 minutes ago

**The Barking Crab** 0.41 mi  
Seafood Restaurant, Bar

**The Barking Crab**  
GIF. Let's see what's on 'tap' for today...



# Ranked retrieval

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In the Boolean model, a document is either *relevant* or *not relevant* to a particular query

It's (usually) impractical to look through all relevant results

Ranked retrieval: for each relevant document, compute a score with respect to the query, and then sort documents based on that score

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# Ranked retrieval: field weights

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Intuition: a document with query terms in its title (or URL) is more relevant for that query



58,400,000 RESULTS Any time ▾

[Hurricane Sandy - Wikipedia, the free encyclopedia](#)

[en.wikipedia.org/wiki/Hurricane\\_Sandy](http://en.wikipedia.org/wiki/Hurricane_Sandy)

[Meteorological history](#) · [Preparations](#) · [Impact](#) · [Relief efforts](#)

**Hurricane Sandy** was a **hurricane** that devastated portions of the Caribbean and the Mid-Atlantic and Northeastern United States, with lesser impacts in the ...

title, address, body  
text match

[Hurricane Sandy : Image of the Day](#)

[earthobservatory.nasa.gov/IOTD/view.php?id=79556](http://earthobservatory.nasa.gov/IOTD/view.php?id=79556)

Acquired October 29, 2012, this natural-color image shows **Hurricane Sandy** approaching the U.S. East Coast shortly before making landfall.

title, body text  
match

---

502-513 OF 673,000 RESULTS Any time ▾

[New Jersey State Bar Association - Homepage](#)

[www.njsba.com](http://www.njsba.com)

Notice to the Bar - Emergent Assistance for Attorneys and Self-Represented Litigants - Reconstructing Active Case Files Damaged or Destroyed by **Hurricane Sandy** at no ...

body text match  
only

---

# Ranked retrieval: field weights

---

Assign weights to fields, use the Boolean model, and then score each document:

$score(q, d) = matched(q, d, field1) * weight(field1) + matched(q, d, field2) * weight(field2) + \dots$   
where  $matched(q, d, f)$  is 1 if the document  $d$  matched the query  $q$  in field  $f$  and 0 otherwise

query: hurricane AND sandy

<i>field</i>	<i>weight</i>
title	0.5
url	0.1
body	0.4

[Hurricane Sandy - Wikipedia, the free encyclopedia](#)

[en.wikipedia.org/wiki/Hurricane\\_Sandy](http://en.wikipedia.org/wiki/Hurricane_Sandy)

[Meteorological history](#) · [Preparations](#) · [Impact](#) · [Relief efforts](#)

**Hurricane Sandy** was a **hurricane** that devastated portions of the Caribbean and the Mid-Atlantic and Northeastern United States, with lesser impacts in the ...

$$score = 1 * 0.5 + 1 * 0.1 + 1 * 0.4 = 1$$

[New Jersey State Bar Association - Homepage](#)

[www.njsba.com](http://www.njsba.com)

Notice to the Bar - Emergent Assistance for Attorneys and Self-Represented Litigants - Reconstructing Active Case Files Damaged or Destroyed by **Hurricane Sandy** at no ...

$$score = 0 * 0.5 + 0 * 0.1 + 1 * 0.4 = 0.4$$

Exercise: Can we implement field-specific matching using a single postings list?

# Ranked retrieval: term frequency

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Both documents match the query "Boston" – but the left is more relevant

<p><b>Boston</b> (pronounced <span><span>/<span><span>b</span><span>ɒ</span><span>s</span><span>t</span><span>ə</span><span>n</span></span>/</span></span> or locally <span><span>/<span><span>b</span><span>o</span><span>s</span><span>t</span><span>ə</span><span>n</span></span>/</span></span> <span><span><span></span><span></span><span></span></span><span> </span>(<span></span>listen)</span>) is the capital of the Commonwealth of Massachusetts and its largest city,<sup>[12]</sup> and is one of the oldest cities in the United States. It was named <b>Boston</b> by early settlers from <b>Boston</b>, Lincolnshire in England. The largest city in New England, <b>Boston</b> is regarded as the unofficial "Capital of New England" for its economic and cultural impact on the entire New England region.<sup>[13]</sup> The city proper, covering 48.43 square miles (125.43 square km), had an estimated population of 625,087 in 2011 according to the U.S. Census,<sup>[17]</sup> making it the 21st largest in the country.<sup>[6]</sup> <b>Boston</b> is also the anchor of a substantially larger metropolitan area called Greater <b>Boston</b>, home to 4.5 million people and the tenth-largest metropolitan area in the country.<sup>[9]</sup> Greater <b>Boston</b> as a commuting region<sup>[14]</sup> is home to 7.6 million people, making it the fifth-largest Combined Statistical Area in the United States.<sup>[10][15]</sup></p> <p>In 1630, Puritan colonists from England founded the city on the Shawmut Peninsula.<sup>[16]</sup> The city thrived, becoming the largest in British America and the third largest city in the British Empire (behind London and Bristol). During the late 18th century, <b>Boston</b> was the location of several major events during the American Revolution, including the <b>Boston</b> Massacre and the <b>Boston</b> Tea Party. Several early battles of the American Revolution, such as the Battle of Bunker Hill and the Siege of <b>Boston</b>, occurred within the city and surrounding areas. Through land reclamation and municipal annexation, <b>Boston</b> has expanded beyond the peninsula. After American independence was attained <b>Boston</b> became a major shipping port and manufacturing center,<sup>[16]</sup> and its rich history helps attract many tourists, with Faneuil Hall alone attracting over 20 million every year.<sup>[17]</sup> The city was the site of several firsts, including the United States' first public school, <b>Boston</b> Latin School (1635),<sup>[18]</sup> and the first subway system in the United States (1897).<sup>[19]</sup></p>	<p>The British Empire at the time operated under the mercantile system, where all trade was concentrated inside the Empire, and trade with other empires was forbidden. The goal was to enrich Britain—its merchants and its government. Whether the policy was good for the colonists was not an issue in London, but Americans became increasingly restive with mercantilist policies<sup>[20]</sup></p> <p>Britain implemented mercantilism by trying to block American trade with the French, Spanish or Dutch empires using the Navigation Acts, which Americans avoided as often as they could. The royal officials responded to smuggling with open-ended search warrants (<i>Writs of Assistance</i>). In 1761, <b>Boston</b> lawyer James Otis argued that the writs violated the constitutional rights of the colonists. He lost the case, but John Adams later wrote, "Then and there the child Independence was born."<sup>[21]</sup></p> <p>In 1762, Patrick Henry argued the <i>Parson's Cause</i> in the Colony of Virginia, where the legislature had passed a law and it was vetoed by the king. Henry argued, "that a King, by disallowing Acts of this salutary nature, from being the father of his people, degenerated into a Tyrant and forfeits all right to his subjects' obedience".<sup>[22]</sup></p>
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Intuition: documents that mention query terms more often are more relevant for that query

*Term frequency*:  $tf(t, d)$ : the number of occurrences of the term  $t$  in the document  $d$ .

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# Ranked retrieval: document frequency

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Many cnn.com articles contains "Boston" (6,956); fewer (356) contain "Celtics". For the query "Boston Celtics", a document that has only "Celtics" is more relevant than a document that has only "Boston".

Intuition: documents with rare terms from the query are more relevant

**Randy Moss' mess, Big East clash, Celtics take on Bucks** Updated Wed November 3, 2010

Randy Moss' ability on the field garnered him the nickname "Freak" early in his career. Luckily for him, his nicknames off the field never stuck. The Minnesota Vikings officially placed the talented-yet-trouble wide receiver on waivers Tuesday, meaning...

<http://news.blogs.cnn.com/2010/11/03/andy-moss-mess-big-east-clash-celtics-take-on-bucks/>

**Bain executive: Attacks against company are 'hyperbole'** Updated Sun September 30, 2012

(CNN) – An executive at Bain Capital, the private equity firm where Mitt Romney's was once CEO, described the attacks against his company this election year as an expected exaggeration. "Hyperbole has been part of elections since the days of John...

<http://politicalticker.blogs.cnn.com/2012/09/30/bain-executive-attacks-against-company-are-hyperbole/>

*Document frequency:  $df(t)$ : the number of documents that contain the term  $t$*

---

# Ranked retrieval: tf-idf

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- Term frequency,  $tf(t, d)$ , suggests the importance of a term  $t$  within a particular document  $d$
  - Document frequency,  $df(t)$ , compensates for terms that appear too often throughout the collection
    - Define inverse document frequency:  $idf(t) = \log(N / df(t))$ , where  $N$  is the number of documents in the collection
    - $idf(t)$  is high for rare terms, low for frequent terms
  - For term  $t$  in document  $d$ ,  $tf-idf(d, t) = tf(t, d) * idf(t)$ 
    - Highest if  $t$  occurs frequently in  $d$  and  $t$  appears in few documents
    - Lower if  $t$  occurs rarely in  $d$  or  $t$  appears in many documents
    - Lowest when  $t$  is in almost all documents
  - Then:  $score(q, d) = tf-idf(term1, d) + tf-idf(term2, d) + \dots$
-



# Scoring explanations

```
▼ _explanation: {
  value: 9.487104,
  description: "sum of:",
  ▼ details: [
    {
      value: 4.582348,
      description: "weight(name:neptun in 172658), product of:",
      ▼ details: [
        {
          value: 0.6949878,
          description: "queryWeight(name:neptun), product of:",
          ▼ details: [
            {
              value: 10.549475,
              description: "idf(docFreq=228, maxDocs=3214547)"
            },
            {
              value: 0.0658789,
              description: "queryNorm"
            }
          ]
        },
        {
          value: 6.593422,
          description: "fieldWeight(name:neptun in 172658), product of:",
          ▼ details: [
            {
              value: 1,
              description: "tf(termFreq(name:neptun)=1)"
            },
            {
              value: 10.549475,
              description: "idf(docFreq=228, maxDocs=3214547)"
            },
            {
              value: 0.625,
              description: "fieldNorm(field=name, doc=172658)"
            }
          ]
        }
      ]
    }
  ]
}
```

To enable, set "explain" to *true* in the search request

"neptun" appeared once in the document and in 228 total documents:  
tf=1,  
df=228,  
 $idf=1+\log(3214547/(228+1))$

ES: Set search\_type=dfs\_query\_then\_fetch for accurate distributed tf-idf computation

# The vector space model

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Let  $T$  be the set of all terms. We can represent each document  $d$  as a vector  $V(d)$  having  $|T|$  components:

$$V(d) = (tf-idf(d, term1), tf-idf(d, term2), \dots)$$

(let  $tf-idf(d, t)$  be 0 if  $d$  does not contain  $t$ )

$$\text{as a unit vector: } v(d) = V(d) / \|V(d)\|$$

(normalizes for document length)

We can use this approach for queries, also

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# The vector space model: cosine similarity

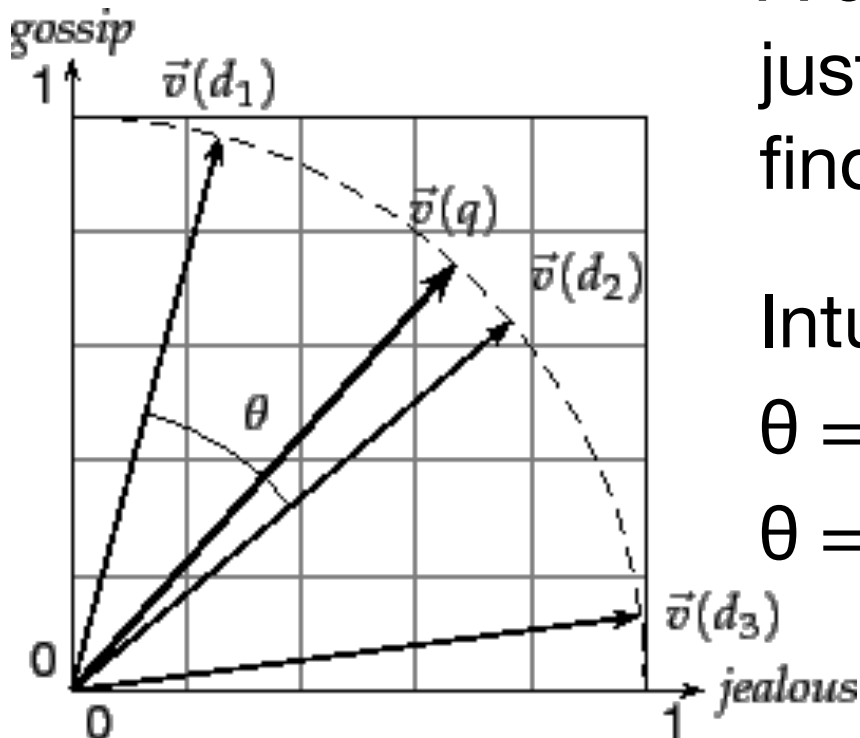
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A document and a query are just (unit) vectors, so we can find the angle between them

Intuition:

$\theta = 0^\circ$  if identical

$\theta = 90^\circ$  if completely dissimilar



$\cos(0^\circ) = 1$   
 $\cos(30^\circ) = 0.866$   
 $\cos(45^\circ) = 0.707\dots$   
 $\cos(60^\circ) = 0.5$   
 $\cos(90^\circ) = 0$

$$\begin{aligned} \text{similarity}(d, q) &= \|v(d)\| \|v(q)\| \cos \theta = \cos \theta \\ &= v(d) \cdot v(q) \end{aligned}$$

# The story so far

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*Field weighting* is a basic *ranked retrieval* approach

*Term frequency*:  $tf(t, d)$ : the number of occurrences of the term  $t$  in the document  $d$

*Document frequency*:  $df(t)$ : the number of documents that contain the term  $t$

*tf-idf* weighting combines these measures

IR engines provide:

- ✓ Efficient access to large collections
  - ✓ Flexible matching
  - ✓ Ranked retrieval
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# Further reading

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<i>topic</i>	<i>elasticsearch implementation</i>
Boolean model of information retrieval	<a href="#">Filters in the Query DSL</a>
Flexible matching	<a href="#">Analysis</a> Recommended reading: <a href="#">Lucene in Action, 2nd Edition</a> , chapter 4
Vector space model of information retrieval	<a href="#">Scoring overview</a> <a href="#">Similarity details</a> <a href="#">Scoring explanations</a>
Geospatial search	<a href="#">geo_shape query</a> <a href="#">David Smiley's presentation</a>
Numeric range queries	<a href="#">NumericRangeQuery</a> (clever!)

Recommended reading: [Introduction to Information Retrieval](#) by Manning et al., [Taming Text](#) by Ingersoll et al.

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# Thank you

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