Introduction



Tecnologías de Gestión de Información No Estructurada Prof. Dr. David E. Losada







Máster Interuniversitario en Tecnologías de Análisis de Datos Masivos: Big Data

Big Data

raw data => actionable knowledge

optimize **decision making** in many application domains (health, security/safety, education, science, BI, ...)

"see" useful **hidden** information & knowledge **buried** in the data

managing and analyzing large amounts of text data can help users manage and make use of text data in all kinds of applications



Text Data

natural language text

(e.g., English text)



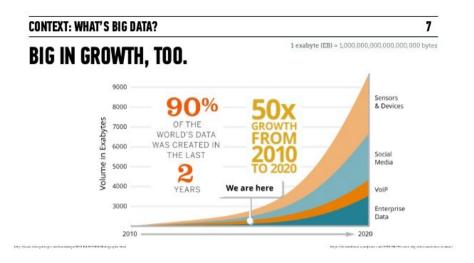
web pages, social media data (e.g., tweets), news, scientific literature, emails, government documents, enterprise data ...

production & consumption of large amounts of text data every day

all kinds of topics



Explosive Growth



impossible for people to consume all the relevant text data in a timely manner

need for intelligent information retrieval systems to help people manage the text data and get access to the

needed relevant info



Text Data

as a **special kind of big data** text data offer a great opportunity to discover **knowledge** useful for many applications

for example, opinionated text data

(product reviews, forum discussions, social media)

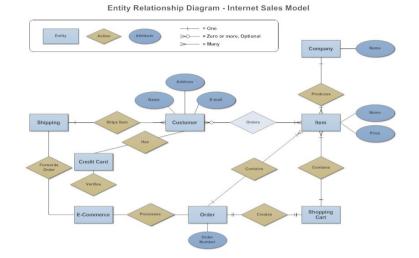




Structured Data vs Unstructured Data

Structured data:

well-defined schemaseasy for computers to handle



Unstructured data (e.g. text):

less explicit structure

requires computer processing

to understand the content

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Understanding Text

NATURAL AGE PROCESSING

natural language processing (nlp) has not yet reached a point to enable a computer to precisely understand text

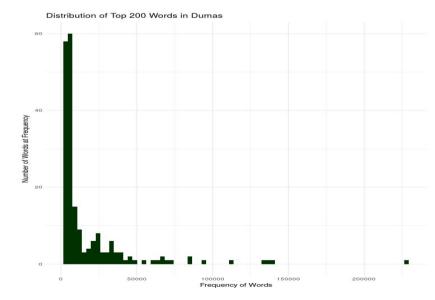
statistical & heuristic approaches to management

and analysis of text data

robust

can be applied to any language

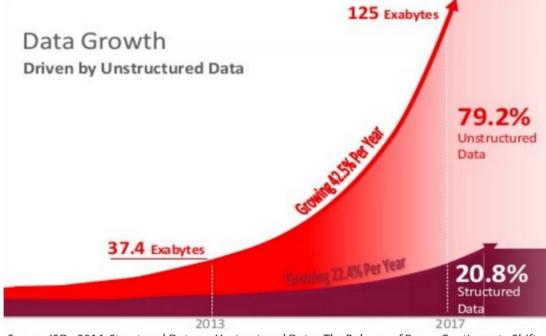
& topic





"the world produces between 1 and 2 **exabytes** (1018 petabytes) of unique information per year, which is roughly 250 megabytes for every man, woman, and child on earth. Printed documents of all kinds comprise only .03% of the

total." [Lyman et al. 2003]



Source: ISD - 2014, Structured Data vs. Unstructured Data: The Balance of Power Continues to Shift

A large amount is textual

Newspapers, magazines, office documents, emails, blog entries, tweets...



text is arguably the most useful kind of info

most natural way of encoding human knowledge

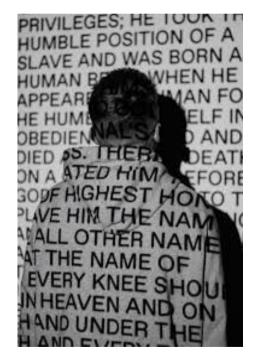
examples: **scientific knowledge** almost exclusively exists in scientific literature, **technical manuals** detailed explanations of how to operate

devices

most common type of info encountered

most expressive form of info

text used to describe other media (video, images)





2 related services to manage & exploit big text data

Text Retrieval



no one can possibly digest all info

urgent need for developing intelligent text retrieval systems to help people get access to the needed relevant information quickly and accurately

search engines



useful not only for the web!

useful anywhere there is a relatively large amount of text data (e.g., desktop search, enterprise search or literature search).



2 related services to manage & exploit big text data

Text Mining

text data: rich in semantic content

valuable knowledge, info, opinions, preferences

opportunity for discovering knowledge

useful for many applications

intelligent software tools

discover relevant knowledge optimize decisions



text mining is not yet as mature as search engines

text has less explicit structure

the development of intelligent mining tools requires computers to understand the content encoded in text



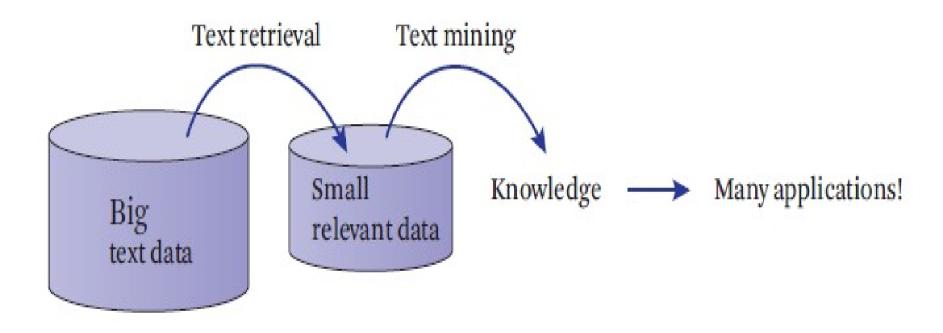


Figure 1.1 Text retrieval and text mining are two main techniques for analyzing big text data.



text information system (TIS)

Information Access

connect the right info with the right user at the right time

a search engine enables a user to access text information through querying

a recommender system can push relevant information to a user as new info

items become available

minimum text analysis sufficient for matching relevant info with a user's info need

original info items are often delivered to the user in their **original form** (though summaries of the delivered items are often provided)

EZOPower Car Charger for Apple iPod Nano 6G 5G 4G 3G 2G 1G ...
www.amazon.com/EZOPower-Charger-Generation.../dp/B004VBJSHA ▼
EZOPower Car Charger for Apple iPod Nano 6G 5G 4G 3G 2G 1G / 6th 5th 4th 3rd ...
Save \$2.00 on EZOPower 3.1A Dual-Outlet USB Car Charger - White when ...

users need to read info items to digest and exploit the delivered info

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text information system (TIS) Knowledge Acquisition (Text Analysis)

acquire useful **knowledge encoded in the text data** that is not easy for a user to obtain without **synthesizing** and **analyzing** a large portion of the data

interesting patterns buried in text



example: a **search engine** returns relevant reviews of a product vs an **analysis engine** that extracts the major positive or negative opinions about the product and compares opinions about multiple products

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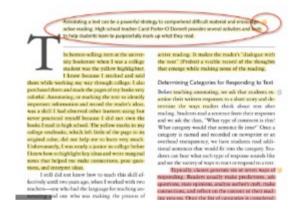
text information system (TIS)

Text Organization

annotate a collection of text documents with meaningful

(topical) structures

Beyond the Yellow Highlighter: Teaching Annotation Skills to Improve Reading Comprehension

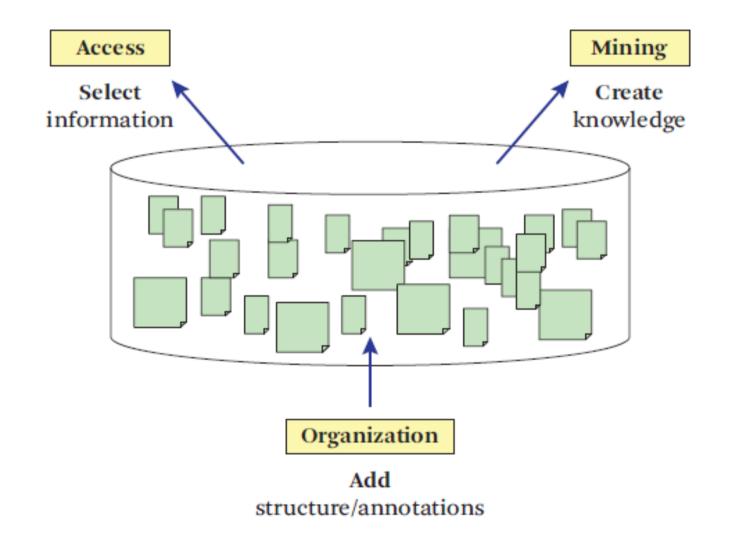


the added structures can allow a user to **search with constraints** on structures or **browse** by following structures





text information system (TIS)





pull vs push

pull

the **user takes initiative** to "pull" the useful info out from the system

the **system plays a passive role** and waits for a user to make a request

e.g. when a user has an ad hoc information need





pull vs push

push

the system takes initiative to "push" (recommend) to the user an info item that the system believes is useful

often works well when the user has a relatively **stable info need** (e.g., hobby)

a system can know "in advance" a user's preferences and interests





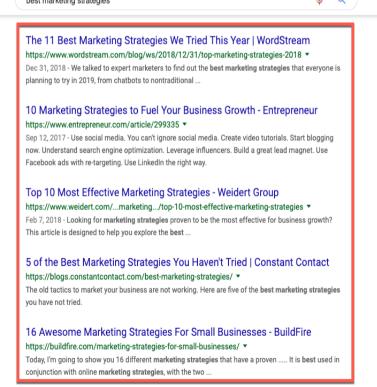




pull mode

querying

the user <u>specifies the information</u> need with a (<u>keyword</u>) query, and the system returns docs that are <u>estimated to be</u> relevant





pull mode

browsing

the user **navigates** along **structures** that **link** info items together and **progressively** reaches relevant info



browsing & querying are interleaved naturally



the process of **text mining** can be defined as mining text data to discover **useful knowledge**

data mining (DM) vs natural language processing (NLP)

DM perspective

to discover and extract interesting **patterns in text data** (latent topics, topical trends, outliers)

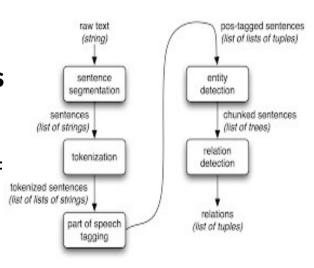


NLP perspective

to partially **understand NL text**, convert text into some form of **knowledge representation** and make **inferences** based on the extracted knowledge.

information extraction. identify and extract mentions of various entities (e.g., people, organization, and location) and their relations (e.g., who met with whom).

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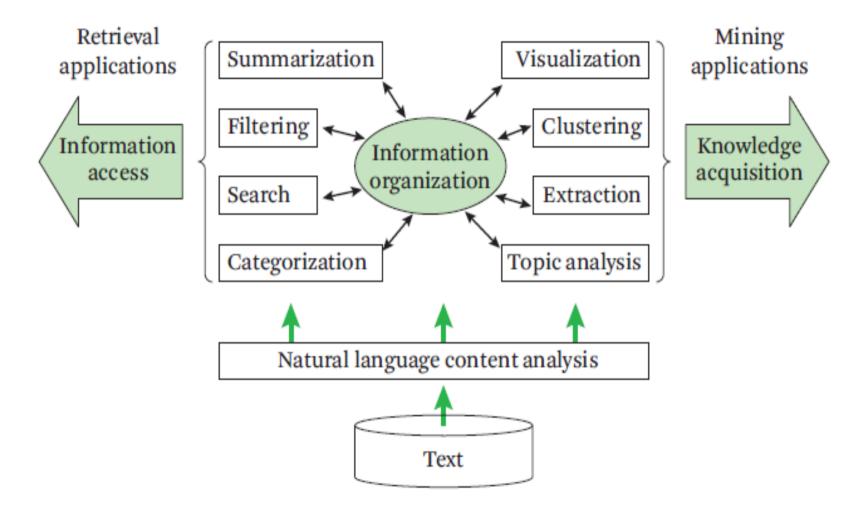


Figure 1.3 Conceptual framework of text information systems.



content analysis

based on NLP

transforms raw text data into more meaningful representations



statistical machine learning enhanced with limited linguistic knowledge

shallow techniques are robust

deeper semantic analysis only feasible for very limited domains

some TIS capabilities (e.g., summarizers) require deeper NLP than others (e.g., search).

most TIS use very shallow NLP (e.g., "bag of words")



search

take a user's query and return relevant documents



filtering/recommendation

monitor an <u>incoming stream</u>, decide which items are relevant (or non-relevant) to a user's interest, and then recommend relevant items to the user (or filter out non-relevant items)



recommender system (goal is to recommend relevant items to users) vs filtering system (whose goal is to filter out non-relevant items to allow a user to keep only the relevant items)



categorization

classify a text object into one or several of the predefined categories

can annotate text objects with

all kinds of meaningful categories enriching the representation text data

organizing text data and facilitating text access

summarization

take one or multiple text documents, and generate a **concise summary** of the essential content.

reduces human effort in digesting text information



topic analysis

take a set of docs and extract and analyze topics in them

topics directly facilitate **digestion of text data** support **browsing** of text data

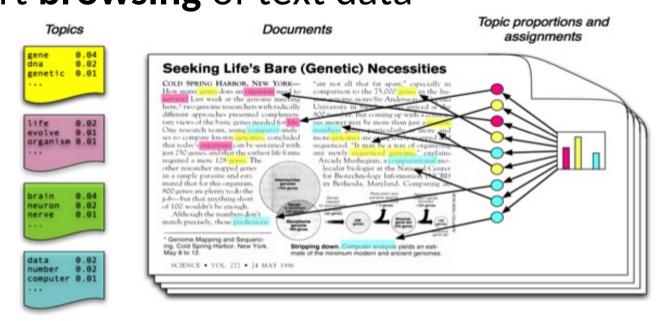


Figure source: Blei, D. M. (2012). Probabilistic topic models. Communications of the ACM, 55(4), 77-84.



topic analysis

can be **combined with non-textual data** (time, location, authors, and other meta data)

can generate interesting patterns (temporal trends of topics, spatio-temporal distributions of topics, etc).

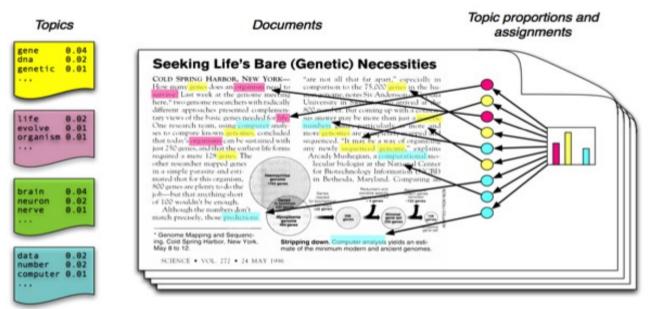
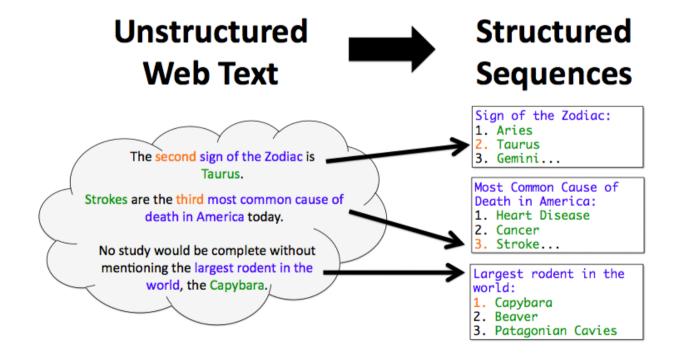


Figure source: Blei, D. M. (2012). Probabilistic topic models. Communications of the ACM, 55(4), 77-84.



information extraction

extract entities, relations of entities or other "knowledge nuggets" from text entity-relation graphs

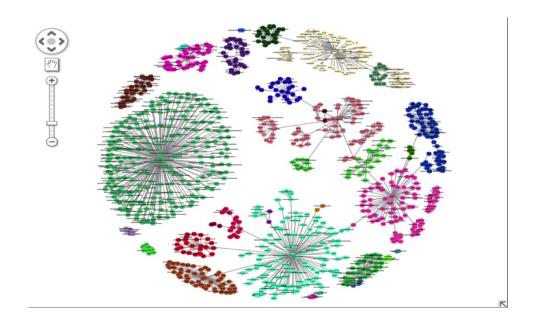




clustering

discover groups of similar text objects (e.g., terms, sentences, docs)

helping users explore an information space also useful for discovering outliers





visualization

visually display patterns in text data

