Text Analytics

Collaborative Learning and Development (Session 2)

Types of Text Mining

Primary Types

Text Analysis: Given a document of free text, how can it be summarized?

Examples:

- Information extraction
- Text summarization
- Text clustering
- Topic Modeling and classification

Text Retrieval \ Search: Given a set of documents containing text, find those closest to an inquiry.

Examples of Searching for:

- Information in documents
- Documents themselves
- Metadata describing documents
- Specific text, images or data in a database



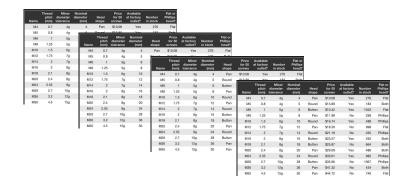
Applications of Text Analysis

Examples:

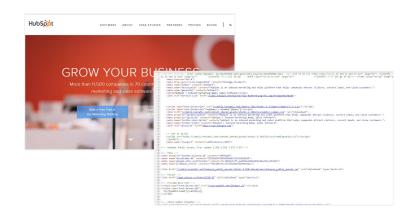
- Opinion and Sentiment analysis
- Feature and frequency summarization for modeling
- VOC summarization
- Post contact churn prediction
- Automatic and dynamic customer service interactions
- Summarization of clinician medical notes
- Entity extraction names, companies, phone numbers, emails, URLs
- Customer journey mapping
- Fraud detection
- Language translation

Text is Unstructured Data

Structured Data



Semi-structured Data



Unstructured Data



Data in **tabular** form (rows and columns) in .csv files, Excel files, relational databases – what you normally think of as consumable data.

Data has "some" structure but is not directly query able with SQL including: a website, markup languages, attribute / key – value pairs.

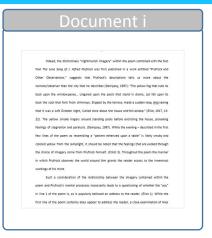
Data that is unstructured includes: **free form text** often found in survey responses, PDFs, emails, transcribed calls / chats, images, social media.

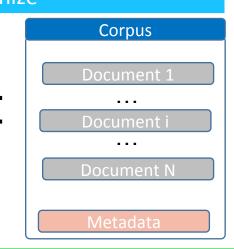
Structuring Text data

1 Unstructured Data

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Organize





Some Structuring Methods

Term Document Matrix

Matrix construction of term frequencies per document (row = document, , col = term, , cell = count of term, in document,).

	Term 1	Term i	Term N
Doc 1	#	#	#
Doc i	#	#	#
Doc N	#	#	#

Positions, nGrams and Spans

"indexing" words by position with hierarchies building up from a single character to a word, to combination of words to distances between words, sentences etc.

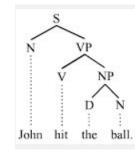
"This is a sentence?"

Character		Word	
Index	Value	Index	Value
1	Т	1	This
2	Н	2	is
3	i	3	а
		4	sentence
19	?	5	?

	Spans	
Start	End	Value
1	4	This
5	5	SPACE
6	7	is
8	8	SPACE
9	9	а
10	10	SPACE
11	18	sentence
19	19	?

Parse Trees

The structuring of Natural Language of text build with a set of rules and dictionaries.



4 Tagging

Identifying specific words and tagging their meanings in context:

- part of speech (Nouns, Verbs, etc.)
- entities (people, companies, etc.)
- belonging to dictionaries (sentiment, industry lexicons, etc.)

ra/at rimson/nn,/, gold/nn,/, purple/nn,/, bronz nd/oc vermili /, inscriptions/nns on/in the/at H irrors/nns,/, as/ql well le/nn saw/nn./. Besides ronse/nn screws/nns,/, silicon/nn /nn bronse/nn llicon/nn bronze/nn Stronghold/nn-tl nails/nns ight-and-a-half-foot/jj bronze/nn statue/nn of

Text Analysis Process – High-Level

Assuming a coherent business question is formed with some potential success metrics and hypothetical courses of action, Here sare some high-level steps that occur during a text analysis process. Though importing is necessary, all other steps are optional and dependent on the analysis or business question at hand.

1 Organize Data

- Import text from source location
- Define document and assimilate Corpus
- Identify (or create Meta data as necessary)

2 Pre-Process Text

 Clean* text as necessary including: punctuation, stemming, stop words, case, extra white space

3 Structure + Classify

- TDM and Index
- Tag with POS, dictionaries or entities
- Topic or theme grouping and disambiguation

Dictionaries

- Stop words
- Sentiment Terms
- Industry Terms
- Company Terms
- Synonyms

4 Pattern Recognition

- Standard data mining techniques
- Clustering
- Regression and Bayesian methods
- Probabilistic models including PCFGs
- Dimensionality reduction

5 Drive Action

- Rule development
- Thematic summarization
- Use of model parameters
- Etc.

Text Analysis - Application Discussion

Free text responses from Survey

Scenario: NPS surveys are sent to customers with an additional free text question of: "Why did you give that score?". How can you leverage these responses?

Data considerations: Data will be short not meant to be grammatically correct. Expect typos, abbreviations, incomplete sentences.

Potential VAIs:

- Identify VOC from extracted themes or topics provided to product teams and sr. mgmt
- Allow for predefined dictionaries of key terms and categorization of responses accordingly delivered to target departments
- Automatically route responses requesting help or claiming terrible service.
- Summarize and trend categorizations of topics to measure improvement on customer pain points

Call transcriptions

Scenario: Voice records of conversations are transcribed into text and saved in log files for support calls between customers and agents. How can you leverage these conversations?

Data considerations: Transcriptions are a computers translation of the human voice. Expect incorrect translations, "back and forths", missed words and for terrible grammar – these are conversations, not essays.

Potential VAIs:

- Sentiment modeling for customer experience scoring and NPS proxying
- Post contact (or in contact) churn risk identification
- Agent coaching and improvement
- Enhanced call topic classification and tracking
- Purchase scoring (lead listing)
- In call support recommendations and knowledge base lookup

Web content

Scenario: Customers (or competitors) create websites as part of their online presence, though websites can be considered "semi-structured" the actual content or text within the html tags is not. How can you glean useful information assuming you can collect that text from their websites?

Data considerations: This is written text, in most cases, intention to look professional. However, it will be chunked and distributed in multiple locations on a site with little to no predefined context other than "this is a website of something".

Potential VAIs:

- Extraction of useful data including phone number, email addresses, company name
- Classification of website (i.e. personal, business, or type of business, or tech savvy vs. novice)
- Needs of website not met (i.e.) collects payments online, but does not have an SSL (i.e.)
- Product, price, feature and promotion extraction of competitors (of ours or of target customers)

Code Bank (R)