



## Information Retrieval



### **Text Classification**



- Our spam filter from probability chapters (now think language modeling), can also be recast as supervised learning
  - Input: text
  - Output: one of a set of predefined classes
  - Features: NLP-based (e.g. word and character n- grams)
    - Bag of words: unigrams
    - Feature selection



### Information Retrieval



- Corpus of "documents"
- Queries in a language
- Result set (relevant documents)
- Presentation of result set

Applications: Libraries, Search engines



# IR Scoring Functions



- An alternative to boolean models (relevant or not), that assigns a numeric score
  - Useful for ranking in presentation
- BM25 function linear weighted combination of score for each term in the query
  - TF (term frequency)
  - IDF (inverse document frequency of the term)
  - Document length





# IR System Evaluation

	In result set	Not in result set
Relevant	30	20
Not relevant	10	40

#### Precision

 The proportion of documents in the result set that are indeed relevant (3/4)

#### Recall

- The proportion of relevant documents that are in the result set (3/5)
- Hard for www
- Also useful for evaluating supervised ML



### IR Refinements



- Beyond words, via NLP
  - Stemming (couch = couches)
  - Semantics (couch = sofa)
  - Usually helps recall at expense of precision
- Google's PageRank and HITS web oriented
- Question Answering "towards" NLP (local research)
  - Web IR for open domain
  - Fall 2010 Al Magazine
  - E.g., CYC, IBM's jeopardy program
  - Again, tradeoff between deeper algorithms (here NLP) versus just more data

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### Information Extraction



 "Skimming" a text and looking for occurrences of a particular class of object and relationships among objects



### Finite-State Automata



- FSAs for attribute-based extraction
  - price
- Cascaded FSTs for relational extraction
  - Multiple attributes and their relations
- Good for restricted, formulaic domains (WSJ merger reports)



# Probabilistic (not rule-based) Models

- HMIVs (chapter 15) for noisy and/or varied texts
  - generative (but don't need)
- CRFs
  - discriminitive



- Acquiring a KB, in contrast to finding the speaker in a talk announcement
- IS-A hierarchy constructed from high precision query templates
  - NounPhrase such as NounPhrase
  - Forces such as gravity and \*
- Automated template construction
- Both sensitive to noise propagation





# **Machine Reading**

- Rather than bootstrapping, towards no human input of any kind
  - NELL: Never-Ending Language Learning
  - <a href="http://rtw.ml.cmu.edu/rtw/">http://rtw.ml.cmu.edu/rtw/</a>
    - Read the Web" is a research project that attempts to create a computer system that learns over time to read the web. Since January 2010, our computer system called NELL (Never-Ending Language Learner) has been running continuously, attempting to perform two tasks each day:
    - First, it attempts to "read," or extract facts from text found in hundreds of millions of web pages (e.g., playsInstrument (George\_Harrison, guitar)).
    - Second, it attempts to improve its reading competence, so that tomorrow it can extract more facts from the web, more accurately.