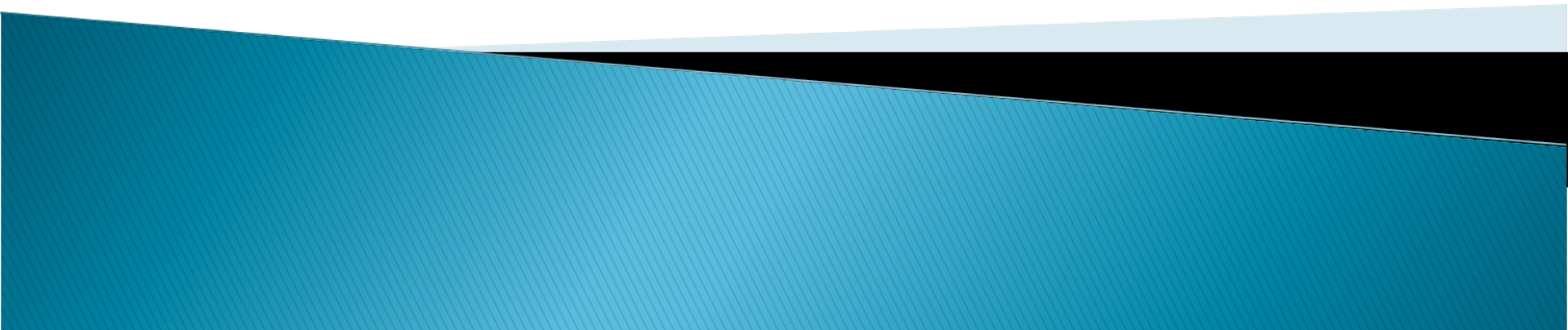


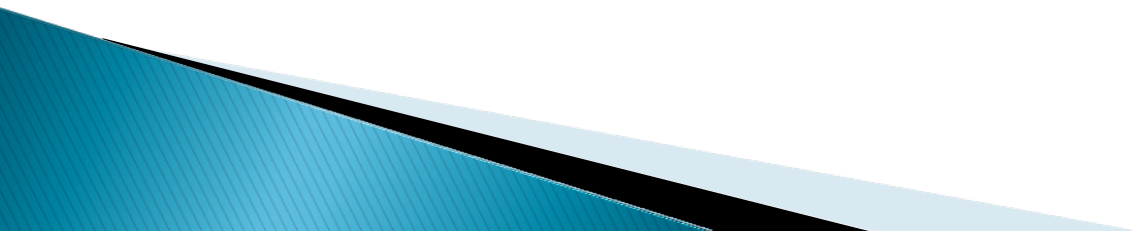
Final Review and Wrap Up

CS4705

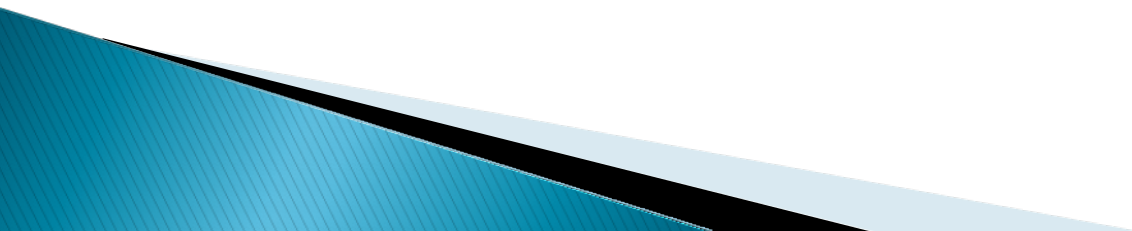
Natural Language Processing



Announcements

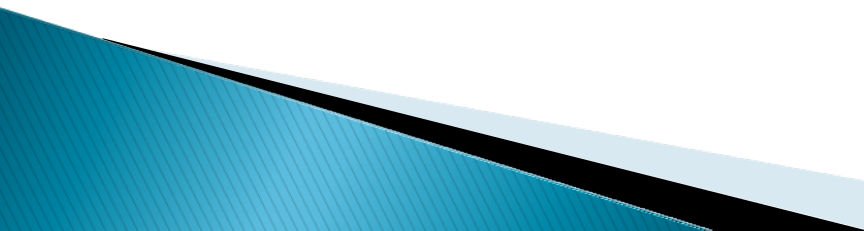
- ▶ Final: December 17th 1:10–4, 1024 Mudd
 - Closed book, notes, electronics
 - ▶ Don't forget courseworks evaluation: only 4% so far have done it.
 - ▶ Office hours as usual next week
- 

What's Next?

- ▶ Natural Language for the Web (Spring 10)
 - **TIME CHANGE: Thursdays 6–8pm**
 - ▶ Spoken Language Processing (Spring 10)
 - ▶ Statistical natural language (Spring 10)
 - ▶ Machine translation (Fall 10)
- 

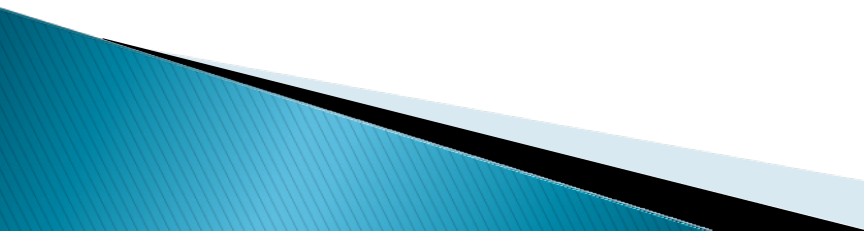
Natural Language for the Web

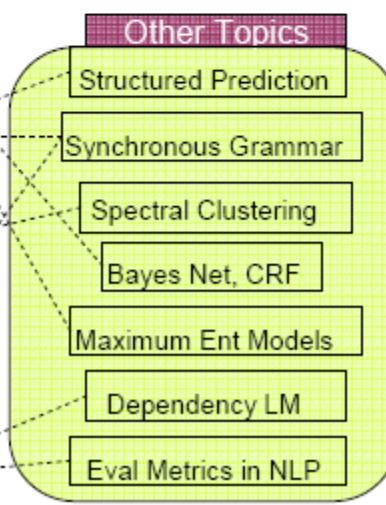
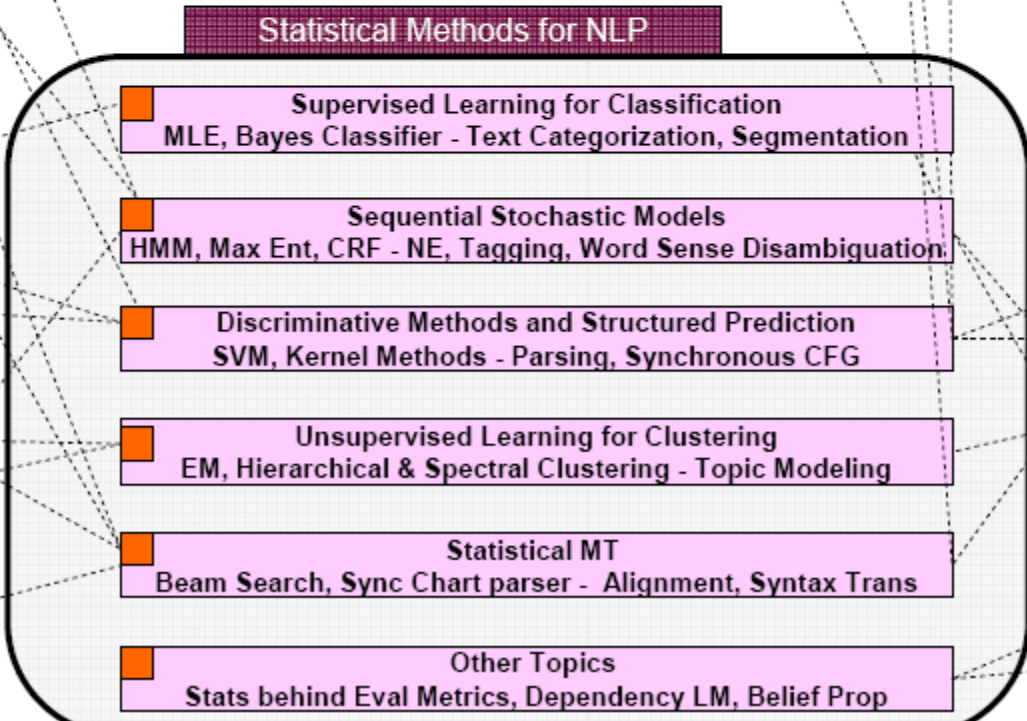
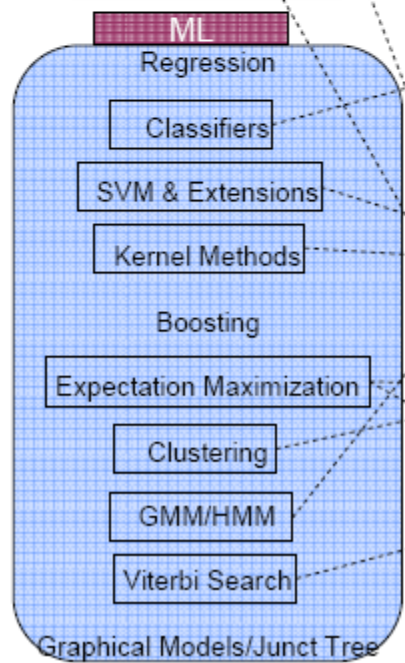
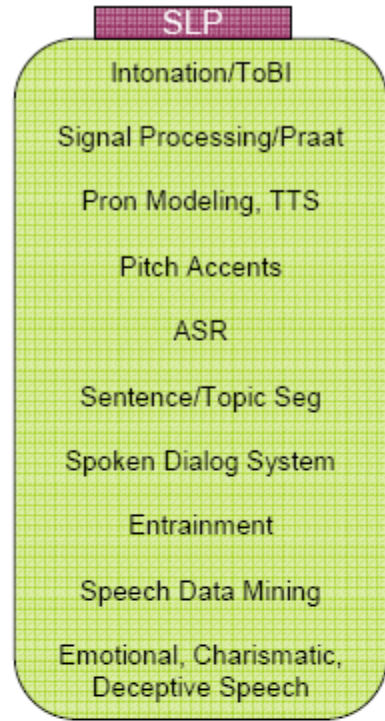
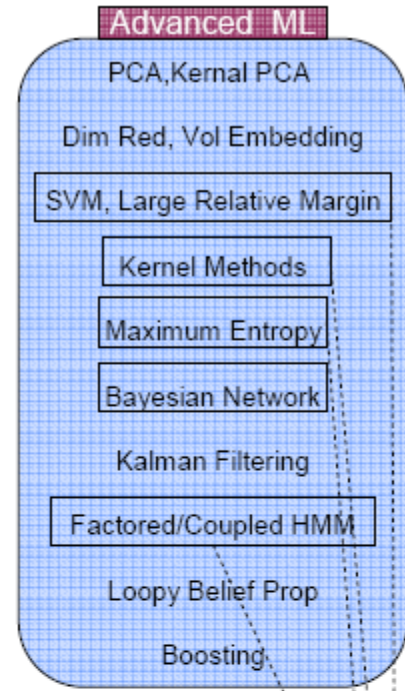
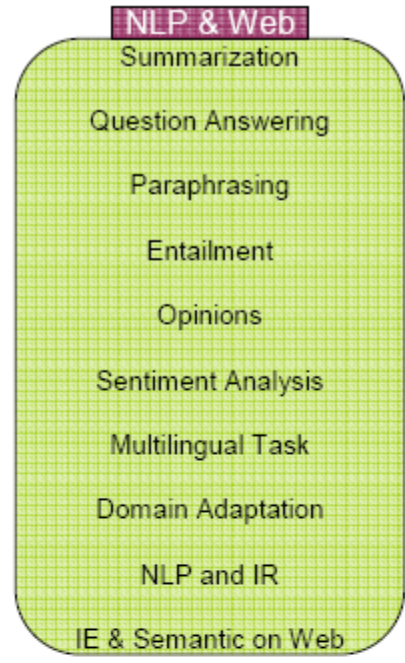
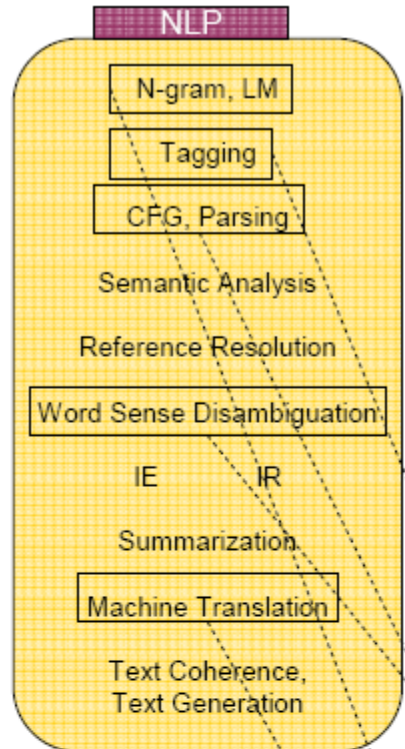
- ▶ Seminar style class
 - ▶ Reading original papers
 - Presentation and discussion
 - ▶ Semester long project

 - ▶ The web contains huge amounts of unstructured documents, both written and spoken, in many languages. This class will study applications of natural language processing to the web. We will study search techniques that incorporate language, cross-lingual search, advanced summarization and question answering particularly for new media such as blogs, social networking, sentiment analysis and entailment. For many of these, we will look at multi-lingual approaches.
- 

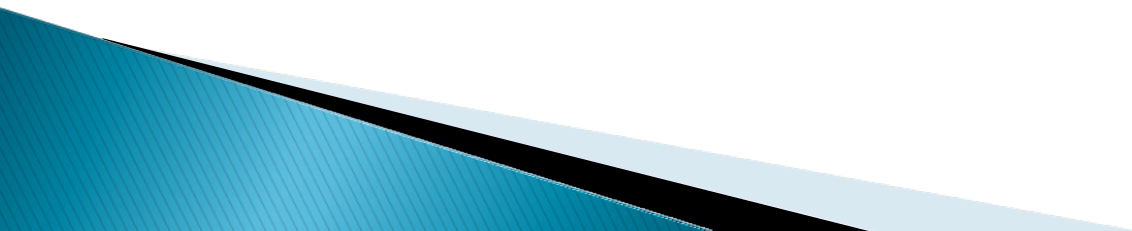
CS 4706: Spoken Language Processing

- ▶ Speech phenomena
 - Acoustics, intonation, disfluencies, laughter
 - Tools for speech annotation and analysis
- ▶ Speech technologies
 - Text-to-Speech
 - Automatic Speech Recognition
 - Speaker Identification
 - Dialogue Systems

- ▶ Challenges for speech technologies
 - Pronunciation modeling
 - Modeling accent, phrasing and contour
 - Spoken cues to
 - Discourse segmentation
 - Information status
 - Topic detection
 - Speech acts
 - Turn-taking
 - ▶ Fun stuff: emotional speech, charismatic speech, deceptive speech....
- 



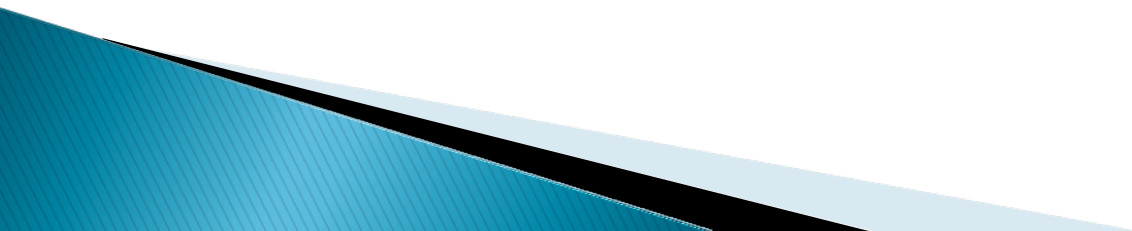
Stop by and visit

- ▶ CS Advising
 - ▶ Recommendation letters
 - ▶ Research project
 - ▶ Advice on applying to graduate school
- 

What is Computational Linguistics? (NLP)

- ▶ An experiment done by outgoing ACL President Bonnie Dorr

Form of Final Exam

- ▶ Fill-in-the-blank/multiple choice
 - ▶ Short answer
 - ▶ Problem solving
 - ▶ Essay
 - ▶ Comprehensive (Will cover the full semester)
- 

Semantics

- ▶ Meaning Representations

- Predicate/argument structure and FOPC

$$\exists x, y \{ \textit{Having}(x) \wedge \textit{Haver}(S, x) \wedge \textit{HadThing}(y, x) \wedge \textit{Car}(y) \}$$

- ▶ Thematic roles and selectional restrictions

Agent/ Patient: George hit Bill. Bill was hit by George

*George assassinated the senator. *The spider assassinated the fly*

▶ Compositional semantics

◦ Rule 2 rule hypothesis

◦ E.g. $\lambda x \lambda y E(e) (Isa(e, Serving) \wedge Server(e, y) \wedge Served(e, x))$

◦ Lambda notation

$\lambda x P(x)$: λ + variable(s) + FOPC expression in those variables

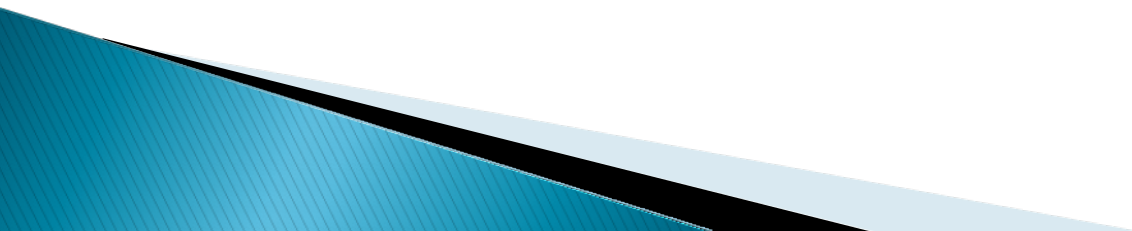
▶ Non-compositional semantics

◦ Metaphor: You're the cream in my coffee.

◦ Idiom: The old man finally kicked the bucket.

◦ Deferred reference: The ham sandwich wants his check.

Sample questions

- ▶ Give the FOPC meaning representation for:
 - John showed each girl an apple.
 - All students at Columbia University are tall.
 - ▶ Given a sentence and a syntactic grammar, give the semantic representation for each word and the semantic annotations for the grammar. Derive the meaning representation for the sentence.
- 



▶ Representing time:

- Reichenbach '47

- **Utterance time** (U): when the utterance occurs
- **Reference time** (R): the temporal point-of-view of the utterance
- **Event time** (E): when events described in the utterance occur

George is eating a sandwich.

-- E,R,U →

George will eat a sandwich?

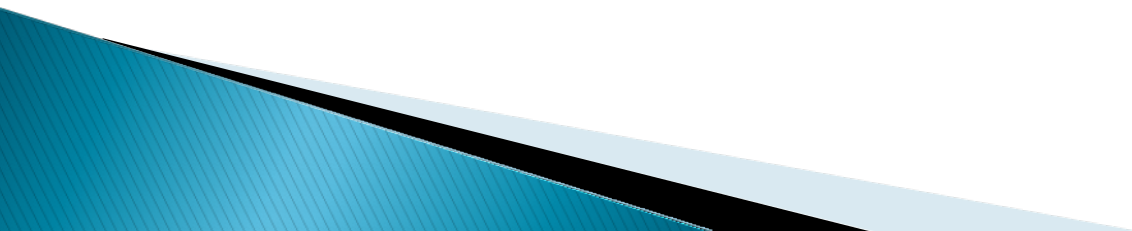
▶ Verb aspect

- Statives, activities, accomplishments, achievements

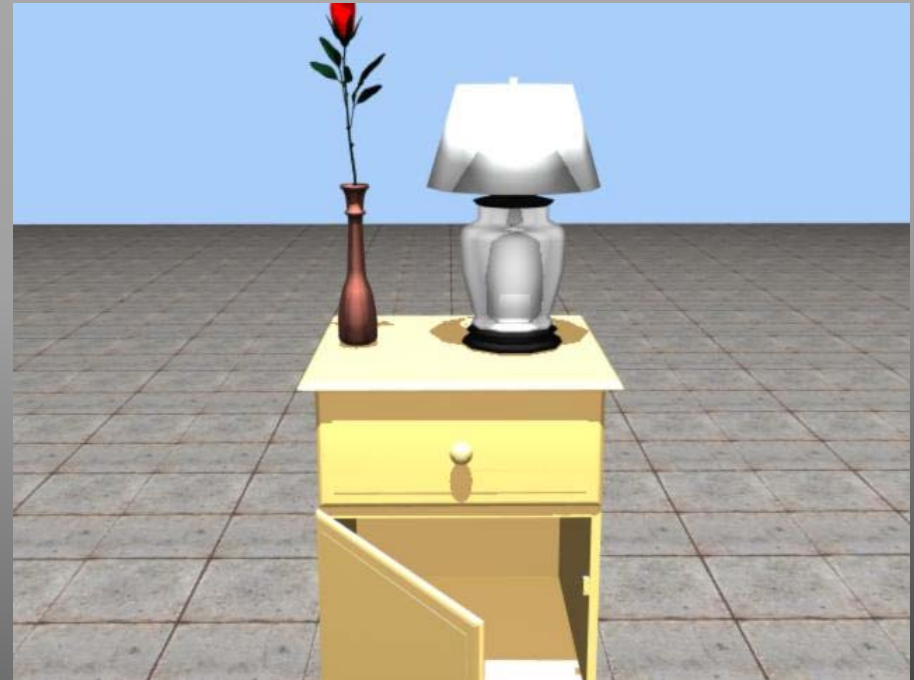
Word Relations

- ▶ Wordnet: pros and cons
- ▶ Types of word relations
 - **Homonymy**: bank/bank
 - **Homophones**: red/read
 - **Homographs**: bass/bass
 - **Polysemy**: Citibank/ The bank on 59th street
 - **Synonymy**: big/large
 - **Hyponym/hypernym**: poodle/dog
 - **Metonymy**: waitress: the man who ordered the ham sandwich wants dessert./the ham sandwich wants dessert.
 - The White House announced the bailout plan.

WordsEye

- ▶ What were some problems with WordNet that required creating their own dictionary?
 - ▶ What are considerations about objects have to be taken into account when generating a picture that depicts an “on” relation?
- 

Implicit Constraint. *The vase is on the nightstand. The lamp is next to the vase.*



Word Sense Disambiguation

Time flies like an arrow.

- ▶ Supervised methods
 - Collocational
 - Bag of words
 - What features are used?
 - Evaluation
- ▶ Semi-supervised
 - Use bootstrapping: how?
- ▶ Baselines
 - Lesk method
 - Most frequent meaning

Robust semantics

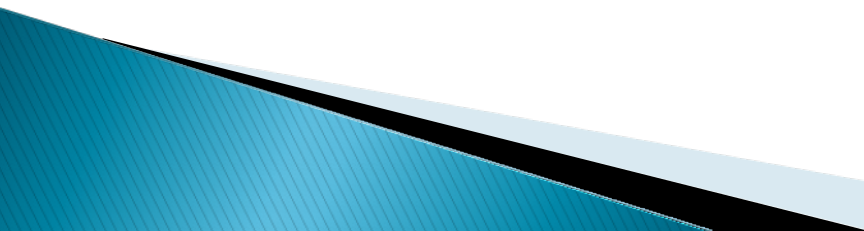
▶ Information Extraction

- Three types of IE: NER, relation detection, QA
- Three approaches: statistical sequence labeling, supervised, semi-supervised
- Learning patterns:
 - Using Wikipedia
 - Using Google
 - Language modeling approach

▶ Information Retrieval

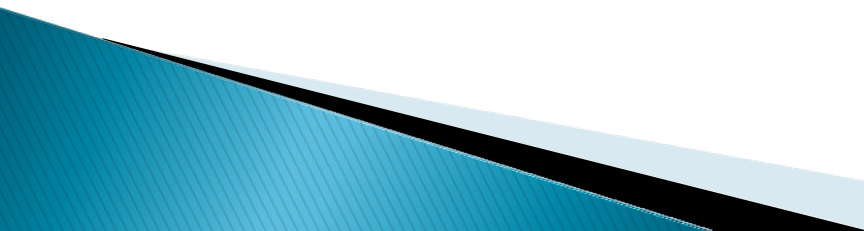
- TF/IDF and vector-space model
- Precision, recall, F-measure

IE Question

- ▶ What are the advantages and disadvantages of using exact pattern matching versus using flexible pattern matching for relation detection?
 - ▶ Given a Wikipedia page for a famous person, show how you would derive the patterns for place of birth.
 - ▶ If we wanted to use a language modeler to answer definition questions (e.g., “What is a quark?”), how would we do it?
- 

Reference

- ▶ Referring expressions, anaphora, coreference, antecedents
- ▶ Types of NPs, e.g. pronouns, one-anaphora, definite NPs,
- ▶ Constraints on anaphoric reference
 - Salience
 - Recency of mention
 - Discourse structure
 - Agreement
 - Grammatical function

- Repeated mention
 - Parallel construction
 - Verb semantics/thematic roles
 - Pragmatics
 - ▶ **Algorithms for reference resolution**
 - Hobbes – most recent mention
 - Lappin and Leas
 - Centering
- 

MT

- ▶ Challenges for MT
 - Orthographical
 - Lexical ambiguity
 - Morphological
 - Translational divergences
- ▶ MT Pyramid
 - Surface, transfer, interlingua
 - Statistical?
 - Word alignment
 - Phrase alignment
- ▶ Evaluation strategies
 - Bleu
 - Human levels of grading criteria

MT Questions

- ▶ How does lexical ambiguity affect MT?
- ▶ Compute the Bleu score for the following example, using unigrams and bigrams:
 - Translation: One moment later Alice went down the hole.
 - References: In another moment down went Alice after it,
 - In another minute Alice went into the hole.
 - In one moment Alice went down after it.
 - [never once considering how in the world she was to get out again.]

Mary did not slap the green witch

Mary not slap slap slap the green witch

Mary not slap slap slap NULL the green witch

Mary no daba una botefada a la verde bruja

Mary no daba una botefada a la bruja verde

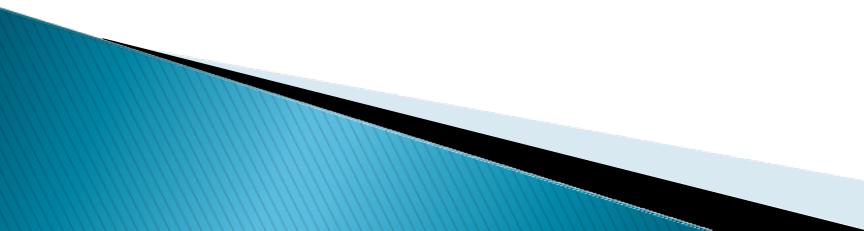
n(3|slap)

P(NULL)

t(la|the)

d(j|i)

Generation

- ▶ Architecture
 - ▶ Why is generation different from interpretation?
 - ▶ What are some constraints on syntactic choice? Lexical choice?
 - ▶ Functional unification grammar
 - ▶ Statistical language generation
 - Overgenerate and prune
 - Input: abstract meaning representation
 - How are meaning representations linked to English?
 - What kinds of rules generate different forms?
- 

- ▶ ((alt GSIMPLE (
- ▶ ;; a grammar always has the same form: an alternative
- ▶ ;; with one branch for each constituent category.
- ▶
- ▶ ;; First branch of the alternative
- ▶ ;; Describe the category clause.
- ▶ **((cat clause)**
- ▶ (agent ((cat np)))
- ▶ (patient ((cat np)))
- ▶ (pred ((cat verb-group)
- ▶ (number {agent number})))
- ▶ (cset (pred agent patient))
- ▶ (pattern (agent pred patient))
- ▶
- ▶ ;; Second branch: NP
- ▶ **((cat np)**
- ▶ (head ((cat noun) (lex {^ ^ lex})))
- ▶ (number ((alt np-number (singular plural))))
- ▶ (alt (; Proper names don't need an article
- ▶ ((proper yes)
- ▶ (pattern (head)))
- ▶
- ▶ ; Common names do
- ▶ ((proper no)
- ▶ (pattern (det head))
- ▶ (det ((cat article) (lex "the"))))))))
- ▶
- ▶ ;; Third branch: Verb
- ▶ **((cat verb-group)**
- ▶ (pattern (v))
- ▶ (aux none)
- ▶ (v ((cat verb) (lex {^ ^ lex})))
- ▶))

An example grammar

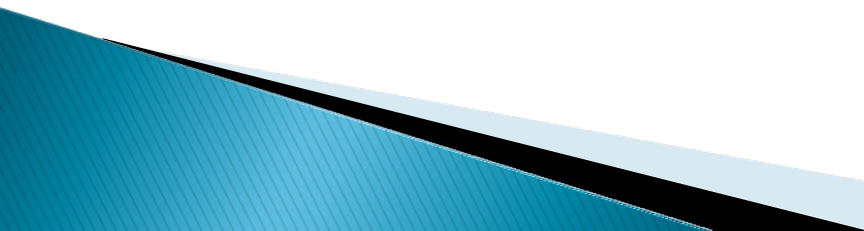
A simple input

- ▶ Input to generate: The system advises John.
- ▶ I1 = ((cat np)
- ▶ (head ((lex "cat")))
- ▶ (number plural))
- ▶ Show unification with grammar.
- ▶ What would be generated?
- ▶ Suppose we wanted to change the grammar so that we could generate "a cat" or "cats"?

Discourse

- ▶ Structure
 - Topic segmentation
 - Lexical Cues for topic shift
 - Lexical repetition
 - Introduction of new words
 - Lexical chains
 - Possible question: given a discourse, compute the lexical repetition score between each block of 2 sentences
- ▶ Coherence
 - Rhetorical Structure
 - Rhetorical relations
 - Nucleus and satellite

Discourse Structure for Generation and Summarization

- ▶ Supervised method to learn rhetorical labels
 - Scientific articles
 - Improved summarization
 - ▶ Content Modeling
 - Learn discourse structures for different topics
 - Domain specific
 - What was the algorithm?
 - How was it used for information ordering and summarization?
- 

- ▶ Thank you and good luck on the exam!
- ▶ Stop by!

Another take: What is Computational Linguistics?

