

# CMSC 325

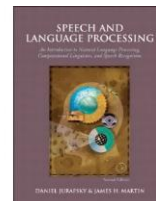
## Computational Linguistics

Fall 2018

Deepak Kumar

### Administrivia

- **CMSC325** Computational Linguistics (see course web page)
- **Instructor:** Deepak Kumar ([dkumar@cs.brynmawr.edu](mailto:dkumar@cs.brynmawr.edu))
- **Lectures:** MW 10:10 to 11:30a
- **Weekly Lab (optional):** F 10:10 to 11:30a
- **Text:** *Speech and Language Processing, 2<sup>nd</sup> Edition*  
Daniel Jurafsky & James Martin
- *Natural Language processing with Python – Analyzing Text with the Natural Language Toolkit (NLTK)*  
Steven Bird, Ewan Klein, and Edward Loper.
- **Software:** Python 3.0 + NLTK



# Computational Linguistics

- Study what goes into getting computers to perform useful and interesting tasks involving human languages
- Also concerned with the insights that such computational work gives us into human processing of language

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## Why care?

- Enormous amount of knowledge is now available in machine readable form as natural language text.
- Conversational agents are becoming common: Siri, Google Voice, Alexa, etc.
- Much of human communication is now mediated by computers.

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## Some Common Applications

- Google Search
- Machine Translation
  - Google Translate
  - Phone apps – iTranslate (Demo)
  - Real-time language/voice translation (Demo)
- Q & A
- Web Analytics
 

Data mining of blogs, discussion forums, message boards, user groups, social media, etc. for...

  - Product marketing information
  - Political opinion tracking
  - Social network analysis
  - Buzz analysis
  - Etc.

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## Google Translate: Buying Lentils in Italy!



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**LENTICCHIA DI CASTELLUCCIO DI NORCIA**  
 dal Ministero delle Politiche Alimentari e Forestali ai sensi del reg. (CE) 510/2006

**RICETTA DI NONNA REGINA**  
*Lenticchia a fuoco lento senza metterla a bagno. 2 spicchi d'aglio, una costa di sedano, a sufficienza. A cottura quasi ultimata quattro cucchiaini d'olio extra vergine di oliva quanto basta. A chi piace, può anche tenere a cottura, salsicce o cotichino.*

**RICETTA TIPICA**  
*Ingredienti per 4 persone:*  
 400 g. di lenticchie, 1 litro d'acqua, 1 spicchio d'aglio, 1 gambo di sedano, sale e pepe. Versare le lenticchie su un tegame possibilmente di coccio, aggiungere l'acqua, l'aglio e il sedano: far cuocere per 20-30 minuti circa. A cottura quasi ultimata aggiungere sale e olio crudo. Servire con pane tostato e olio.

**Importante la lenticchia non va tenuta a bagno. Si consiglia la pulitura a "dito".**

**Prodotta e Confezionata dall'Azienda Agricola SALVATORI REGINA**  
 Viale XX Settembre, 29  
 06046 Norcia (PG)  
 ☎ 0743.816523

Confezionato il: 31/12/2009

Da consumarsi preferibilmente entro 2 anni

SOGGETTO A CALO DI PESO NATURALE TENERE IN LUOGO FRESCO ED ASCIUTTO SI CONSIGLIA LA PULITURA A DITO

NELL'AMBIENTE DOPO L'USO

DA CONSUMARE PREFERIBILMENTE

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**RICETTA TIPICA**  
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 400 g. di lenticchie, 1 litro d'acqua, 1 spicchio d'aglio, 1 gambo di sedano, sale e pepe. Versare le lenticchie su un tegame possibilmente di coccio, aggiungere l'acqua, l'aglio e il sedano: far cuocere per 20-30 minuti circa. A cottura quasi ultimata aggiungere sale e olio crudo. Servire con pane tostato e olio.

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Speech and Language Process... Google Translate

https://translate.google.com/#auto/en/it/...

Translate

English Spanish French Italian - detected English Spanish Arabic Translate

Importante la lenticchia non va tenuta a bagno. Si consiglia la pulitura a dito.

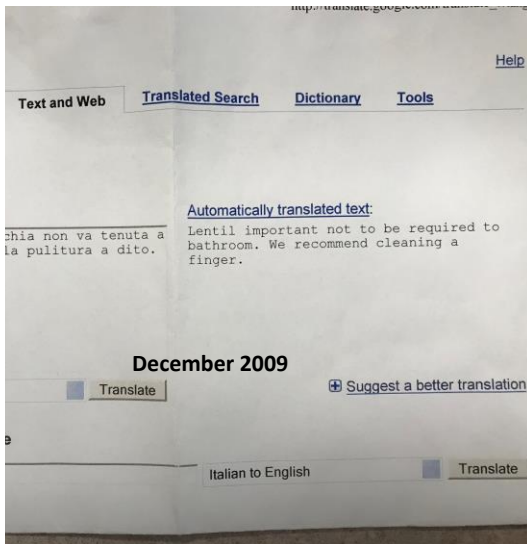
Important lentils should not be kept in the bathroom. Finger cleaning is recommended.

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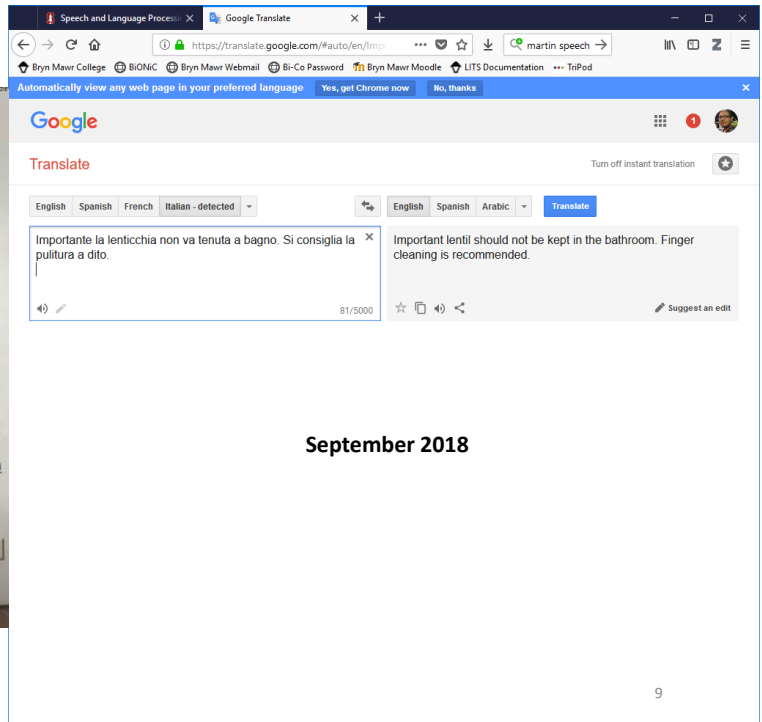
Suggest an edit

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## Some Common Applications

- Google Search
- Machine Translation
  - Google Translate (Demo)
  - Phone apps – iTranslate (Demo – Deepak’s phone)
  - Real-time language/voice translation – Microsoft Research English to Chinese ([Demo](#) start at 5:25)
- Q & A (IBM Watson Jeopardy!, 2011) – [Demo](https://www.youtube.com/watch?v=P18EdAKuC1U)
- Web Analytics
  - Data mining of blogs, discussion forums, message boards, user groups, social media, etc. for...
    - Product marketing information
    - Political opinion tracking
    - Social network analysis
    - Buzz analysis
    - Etc.

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## Topics

- Words
- Syntax
- Meaning
- Discourse

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- Words
- Syntax
- Meaning
- Discourse

Applications exploiting each

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## Applications – Language Processing versus Data Processing?

- An application that requires the use of **knowledge about human languages**

Example: Is Linux/Unix wc (word count) an example of a language processing application?

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## Applications – Language Processing versus Data Processing?

- An application that requires the use of **knowledge about human languages**

Example: Is Linux/Unix **wc** (word count) an example of a language processing application?

- When it counts words:
- When it counts lines and bytes:

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## Applications – Language Processing versus Data Processing?

- An application that requires the use of **knowledge about human languages**

Example: Is Linux/Unix **wc** (word count) an example of a language processing application?

- When it counts words: **Yes**
  - To count words you need to know what a word is. That is knowledge of language.
- When it counts lines and bytes: **No**
  - Lines and bytes are computer artifacts, not linguistic entities.

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## Some big applications requiring knowledge of language

- Question answering
- Conversation agents
- Summarization
- Machine Translation

These require a tremendous amount of knowledge of language.

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## Example

- Siri:

What is the population of Bryn Mawr?

What should I eat today?

Tell me a joke.

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# What knowledge is needed?

- Speech recognition & synthesis

Knowledge of English words (e.g. what they mean,...)

- How groups of words “clump”
  - What the clumps mean?

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# Course Content

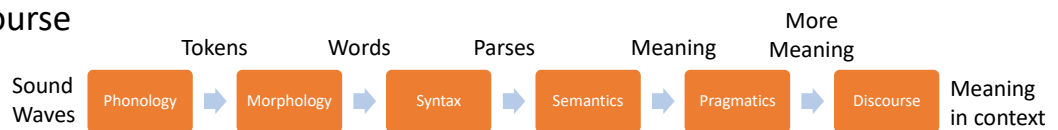
- Linguistic topics
  - Phonology, morphology, syntax, discourse structure
- Formal Systems
  - Regular languages, context-free grammars, logic
- Applications

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# The Pipeline

- Phonology
- Morphology
- Syntax
- Semantics
- Pragmatics
- Discourse



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# Ambiguity

- Computational Linguists are obsessed with ambiguity
- It is a fundamental problem of computational linguistics
- Resolving ambiguity is a crucial goal



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# Ambiguity

- Find at least five meanings of this sentence:

I made her duck.

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# Ambiguity

- Find at least five meanings of this sentence:

I made her duck.

- I cooked duck for her (to eat)
- I cooked the duck she owned
- I created the (plaster?) duck she owns
- I caused her to quickly lower her head or body
- I waved my magic wand and turned her into a duck
- ...

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# Ambiguity is Pervasive

I made her duck.

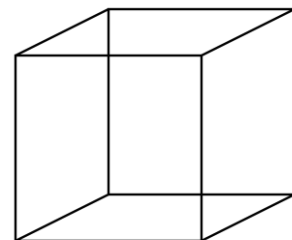
- I caused her to quickly lower her head or body
  - **Lexical category:** “duck” can be a N or V
- I cooked the duck she owned
  - **Lexical category:** “her” can be a possessive (“of her”) or a dative (“for her”)
- I created the (plaster?) duck she owns
  - **Lexical semantics:** “make” can mean “create” or “cook”



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# Ambiguity is Pervasive

- **Phonology**
  - I mate or duck
  - I'm eight or duck
  - Eye maid; her duck
  - Aye mate, her duck
  - I maid her duck
  - I'm aid her duck
  - I mate her duck
  - I'm ate her duck
  - I'm ate or duck
  - I mate or duck



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## Dealing with ambiguity

- **Tightly coupled** interaction among processing levels; Knowledge from other levels can help resolve ambiguity.
- Ignore ambiguity as it occurs and hope that other levels can help resolve it – **Pipeline processing**
- Make the most likely choices – **probabilistic approaches**
- Don't do anything, maybe it won't matter

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## Models & Algorithms

- **Models** – formalisms that are used to capture the various kinds of linguistic knowledge that we need.

State machines, Rule-based approaches, Logical formalisms, Probabilistic models, etc.

- **Algorithms** – used to manipulate the knowledge representations

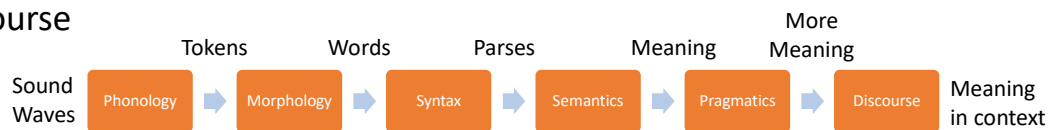
Transducers/filters, state-space search, dynamic programming, classifiers, etc.

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# The Pipeline

- Phonology
- Morphology
- Syntax
- Semantics
- Pragmatics
- Discourse



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## References

- Much of this material extracted from Chapter 1 of Speech & Language Processing by Jurafsky and Martin, 2<sup>nd</sup> Edition. Pearson, 2009.

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