

COSC 6336

Natural Language Processing

Instructor: Tamar Solorio

Some content in these slides was adapted from Prof. Rada Mihalcea

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Logistics and Administrivia

Piazza website (this is where you go to post questions):

piazza.com/uh/spring2020/cosc6336

We will also try out Perusall.com. Create an account at <https://app.perusall.com>

Use code: SOLORIO-S5MPV

More Administtrivia

The course will mostly draw the readings from two freely available online books:

[3rd Edition Book from Jurafsky and Martin](#) (J&M)

[Natural Language Processing by Eisenstein](#) (E)

Tentative schedule

Lecture	Topic	Readings	Assignment
1	ADMINISTRIVIA, INTRODUCTION, Text Processing		
2	Classification: binary and multilabel (Logistic Regression)	J&M 5.0-5.6	
3	HMMs 1 and POS Tagging	J&M 8, E 7.1-7.4	
4	HMMs 2 and POS Tagging		
5	CRFs	E 7.5 & 8.3	CRFs for NEs due 2/10
6	Grammars and Syntactic parsing	J&M 12	
7			
8	Dependency parsing	J&M 15.0-15.4, 15.6	
9	Neural Networks 1	E 3.0-3.3, G 4.0-4.5	
10	Neural Networks 2	https://arxiv.org/pdf/1708.00214	Release specs for Final Project (proposal due 3/4)
11	RNNs	J&M 9.0-9.6	
12	RNNs		RNN Project due 03/01/2020
13	Vector Semantics & Embeddings	J&M 6, G 5, E 14.0-14.6	
14	Word Embeddings 2		
15	Final Project Pitches		Final project proposals due 03/17/2020
16	Language Models (count-based)	J&M, E 6.0-6.2, 6.4	
17	Neural Language Models 1	E 6.3	LM Project due 03/29/2020
18	NLM 2 & ELMo	Elmo paper	
19	Seq2Seq, Attention	Vaswani et al., 2017	
20	Seq2seq cont		Seq2seq project due 01/07/2020
21	Pretrained transformers: GPT, BERT, RoBERTa	BERT	
22	Pretrained transformers: GPT, BERT, RoBERTa	GPT	
23	NLP Applications	RoBERTa	
24			
25	Last Class		
	Final Project Presentations		
	Final Project Presentations		

Grading Criteria

- ★ 50% - Assignments (mini projects, 3-4 total)
- ★ 40% - Final Project
- ★ 10% - In-class participation and quizzes.

Natural?

Natural Language?

language spoken by people, e.g. English, Japanese, Swahili, as opposed to artificial languages, like C++, Java, etc.

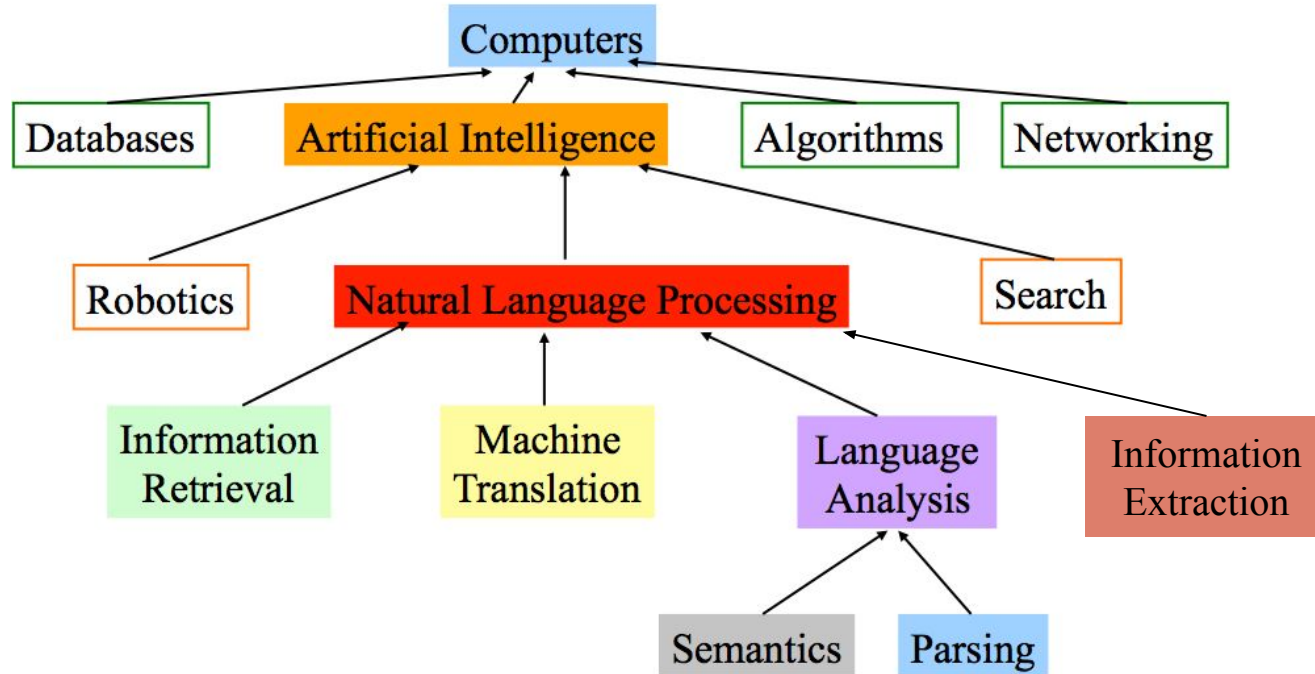
Natural Language Processing

Applications that deal with natural language in a way or another

Computational Linguistics

Doing linguistics on computers, more on the linguistic side than NLP, but closely related

Where does NLP fit in the COSC taxonomy?



Why Natural Language Processing?

★ “... language is what made us human” (Guy Deutscher)

- ★ Through language humans:
- Pass on knowledge
 - Create new thoughts and ideas
 - Express deep (and not so deep) reflections

Why Natural Language Processing?

★ We want to know what's happening in a timely manner!

- To react quickly and effectively

★ People use social media every day

- Around 6,000 tweets are tweeted every second!

★ People post about almost anything they can

- Behavioral aspects, current events, trending brands...



reddit



StackExchange

Why is this important?

★ What about the Hurricane Harvey?



Rae (Roca) Pickett
@RaeRoca

Follow

▼

Anyone in North Houston have a boat and can rescue a 3 & 6 yo, mom, grandma and grandpa and 2 dogs? 1960 Ella street
[#houstonflood](#) [#Rescue](#)

3:44 PM - 27 Aug 2017 from [Annandale, VA](#)

662 Retweets 854 Likes



 38

 662

 854



Why is this important?

★ What about the Hurricane Harvey?

 **Rae (Roca) Pickett**
@RaeRoca

Follow

Anyone in North Houston have a boat and can rescue a 3 & 6 yo, mom, grandma and grandpa and 2 dogs? 1960 Ella street
[#houstonflood](#) [#Rescue](#)



MELO
@4GP5

Follow

5048 Shreveport needs assistance right now
in Port Arthur! 6ft of water in the house!

5:25 PM - 30 Aug 2017 from [Port Neches, TX](#)

69 Retweets 16 Likes



5



69




16



Why is this important?

★ What about the Hurricane Harvey?

**crimsonboudoir**
@crimsonboudoir


Follow





#HELP @uscoastguard ELDERLY WOMAN ALONE NEEDS #IMMEDIATE ASSISTANCE 3 ft of water in house trying to get phone # 729 LINKWOOD Port Aurthur

Jekera hebert @Jekeralenae
Replying to @Jekeralenae
Port Arthur Texas 77642 ..I'm in Houston she's alone

12:20 AM - 30 Aug 2017

1 Retweet 1 Like



 1  1  1 

**MELO**
@4GP5

Follow

5048 Shreveport needs assistance right now in Port Arthur! 6ft of water in the house!




**Rae (Roca) Pickett**
@RaeRoca

Follow

Why is this important?

★ What about the Hurricane Harvey?


**David Sloves**
@Johnny_Champagn





Replying to [@realDonaldTrump](#)


My family is still waiting for a water rescue in the attic, they can't get to roof! 6606 Reamer St
Houston, TX 77074
Please RT

12:17 PM - 27 Aug 2017


112 Retweets 71 Likes



 24  112  71 

**crimsonboudoir**

Follow

**MELO**
@4GP5

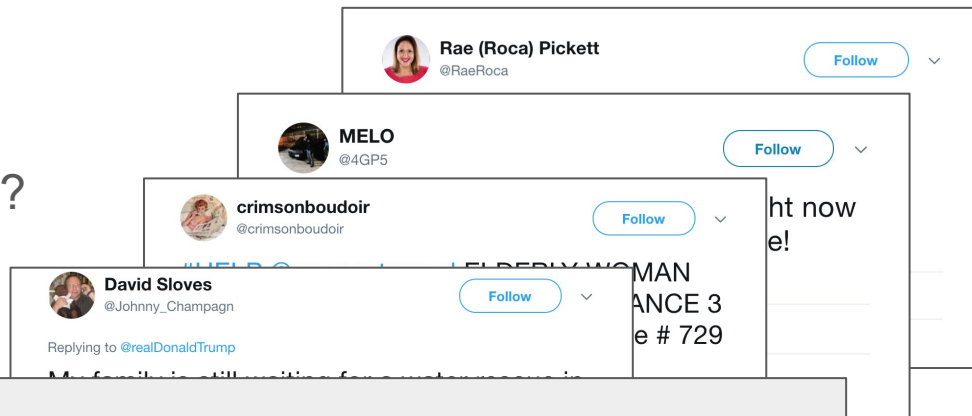
Follow

**Rae (Roca) Pickett**
@RaeRoca

Follow

Why is this important?

★ What about the Hurricane Harvey?



How valuable would have been to systematically detect *the who, the when and the what* of those urgent messages?

Why Natural Language Processing?

- ★ Practical value:
 - Companies want to know what consumers are saying
 - Intelligence communities want to know what persons of interest are planning
 - New products that use language as the interface with humans

- ★ Scientific value:
 - Gain a deeper understanding of how the human brain is able to process language

- ★ Computer programs that can process this data require **NLP expertise**

What's difficult about Natural Language Processing?

- ★ kJfmmfj mmmvvv nnnffn333
- ★ Uj iheale elee mnster vensi credur
- ★ Baboi oi cestnitze
- ★ Coovoel2^ ekk; ldsllk lkdf vnnjfj?
- ★ Fgmflmlk mlfm kfre xnnn!

Computers lack knowledge!

- ★ People have no trouble understanding language
 - Common sense knowledge
 - Reasoning capacity
 - Experience
- ★ Computers have
 - No common sense knowledge
 - No reasoning capacity

Levels of Analysis

★ Speech

- Phonology

★ Text

- Morphology
- Syntax
- Semantics
- Pragmatics

★ Interaction between levels

Some NLP applications

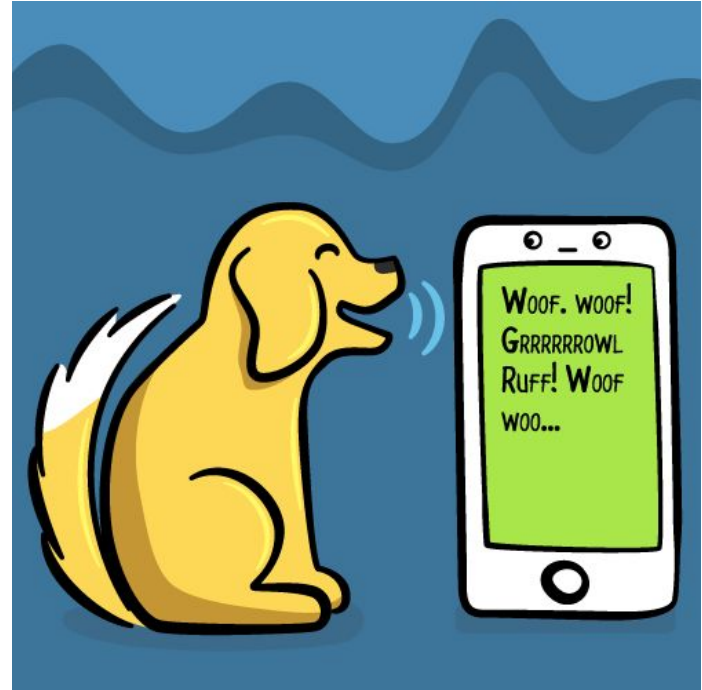
- ★ Speech recognition
 - Voicemail transcription
- ★ Dialogue systems
 - Alexa, Google home, Siri, Cortana
- ★ Information extraction
 - Named Entity Recognition and Linking
 - Event detection
- ★ Machine translation
 - Text to text
 - Speech to speech

Challenges in NLP

Main issue is ambiguity

Ambiguity in Speech

- ★ 264 Lane Street vs. 26 four-lane street
- ★ For invoices vs foreign voices
- ★ Colorectal cancer risks vs co-director cancel risks
- ★ Frapuccino vs Fred Paccino



Ambiguity in Morphological Analysis

ride	rideable
do	doable
like	likeable

★ Pattern: Verb + “able” → Adjective (able to do/be Verb-ed)

Ambiguity in Morphological Analysis

happy	unhappy
cool	uncool
stable	unstable

★ Pattern: “un” + Adjective → Adjective (not Adjective)

Ambiguity in Morphological Analysis

do	undo
zip	unzip
dress	undress

★ Pattern: “un” + Verb → Adjective (to reverse Verb-ing)

Ambiguity in Morphological Analysis

What about the word **unlockable**?

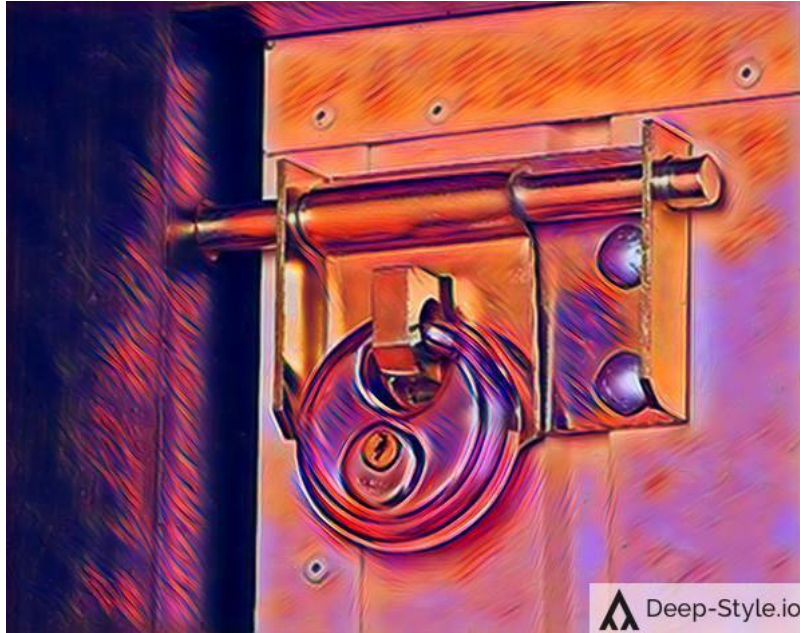


Image source: <http://plywoodchair.com/wp-content/uploads/2015/03/Garage-Door-Lock-Mechanism-Mesmerizing-Door-Design-Ideas.jpg>

Ambiguity in Morphological Analysis

unlockable

Option 1:

“un” + lock (Verb) → unlock (Verb) (to reverse locking)

unlock + “able” → unlockable (Adjective) (able to unlock)

Option 2:

lock + “able” → lockable (Adjective) (able to lock)

“un” + lockable → unlockable (Adjective) (not able to lock)

Ambiguity in Syntax



Ambiguity in Syntax

- ★ Jake told Mike he has cancer
- ★ Eat spaghetti with meatballs vs eat spaghetti with chopsticks
- ★ We saw the Eiffel Tower flying to Paris
- ★ Old men and women

Small surface changes → Big changes in interpretation

Only he told her that he loved her

Small surface changes → Big changes in interpretation

Only he told her that he loved her

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He told her that he loved her only

More Issues in Syntax

Anaphora resolution:

“The dog entered my room. It scared me”

Preposition attachment:

“I saw the man in the park with a telescope”

Issues in Semantics

Understand language, but how?

- ★ “plant” = industrial plant
- ★ “plant” = living organism

Words are ambiguous by design

What is the relevance of getting the semantics right?

- ★ Machine translation (wrong translations)
- ★ Information retrieval (wrong information)

Challenges in Information Extraction

The closure of California's main coastal road demonstrates just how badly these mudslides have damaged this picturesque seaside town, which is simultaneously reeling from the flooding-related deaths of at least 20 residents following the storm early Tuesday morning.

The storm destroyed at least 65 homes and damaged at least 460 more, authorities said. Firefighters are continuing their painstaking work of combing through the debris with heavy equipment and hand tools, aware more bodies are likely buried beneath. At least four people remain missing.

How many deaths? 20? 65? 460? Where? California's coastal road

How many houses destroyed? 20? 65? 460?

Challenges in Information Extraction

Detect new patterns:

- ★ Detect hacking / hidden information / etc./
- ★ Gov. mil, puts lots of money into IE research

Challenges in Information Retrieval

- ★ General model:
 - A huge collection of texts
 - A query
- ★ Task: find documents that are relevant to the given query
- ★ How? Create an index, like the index in a book
- ★ More ...
 - Vector-space models
 - Boolean models
- ★ Examples: Google, Yahoo, Baidu, etc.

Challenges in Information Retrieval

- ★ Retrieve specific information
- ★ Question Answering:
 - What's the age of the Earth?
 - Approx. ~ 4.5 billion years
- ★ Cross Language Information Retrieval
- ★ What's the minimum age requirement for car rental in Italy?
- ★ Integrate large number of languages
- ★ Integrate into performant IR engines

So Far...

Lots of interesting challenges that require NLP to address them!

First Reading Assignment

★ [J&M 5.0-5.6](#)

Due 01/15/2020 Before coming to class

Next Class

- ★ Review of classification, binary and multiclass