Natural Language Processing Lecture I. Introduction and Syllabus

Forrest Sheng Bao, Ph.D.

Dept. of Computer Science lowa State University Ames, IA 50011

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Outline

The Instructor

Natural Language Processing

The Instructor

My research

My PhD dissertation is not on NLP, ML nor CV. My PhD dissertation is about GOFAI.

- Artificial Intelligence
 - ► Knowledge Representation and Reasoning
 - Natural Language Processing
- ► Al's applications in other sciences
 - Routing and palcements in IC and PCB designs
 - ▶ Reinforcement learning for storage systems
 - NLP for biomedical papers

Carl Gauss, Letter to Bolyai (1808)

When I have clarified and exhausted a subject, then I turn away from it, in order to go into darkness again.

* I am a tenth generation academic descendant of Carl Gauss.

What (Un)Natural Languages are







- Lots of data, e.g., Amazon reviews
- Against computer programming languages
- Very easy to handle: discretized objects
- Very difficult to handle: unstructured, ambiguity, variety, etc.

Why do we study NLP...instead of other hot areas in Al

- Unlike other animals, we have complicated languages.
- Languages make us great:

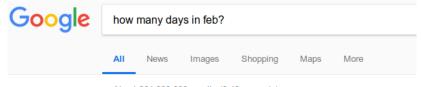
"a group of people get together and exist as an institution that we call a company so they are able to accomplish something collectively which they could not accomplish separately"—The HP Way.

- When we spoke the same langauge, even God was afraid.
- "And the LORD said, Behold, the people is one, and they have all one language; and this they begin to do: and now nothing will be restrained from them, which they have imagined to do."—Genesis 1:6
 - NLP is about understanding ourselves.

NLP vs. speech-related research

- NLP usually does not cover speech-related research, such as automatic speech recognition (ASR, speech-to-text) or speech synthesis (text-to-speech, TTS)
- Speech is about vocal time series, acoustic signals, or waves.
- NLP usually deals with the written form of languages, i.e., the scripts.
- For example, Siri, Cortana, Alexa have both speech part and NLP part.

NLP is far from expectation (circa. 2018)



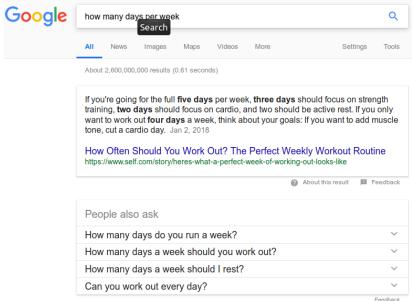
About 364,000,000 results (0.48 seconds)

Leap Day: February 29. A Leap Day, February 29, is added to the calendar during leap years. This extra day makes the year 366 days long – not 365 days, like a common year.

Next Leap Day: February 29, 2020 - TimeAndDate.com https://www.timeanddate.com/date/leap-day.html



NLP is far from expectation (circa. 2018)



Videos

Winograd Schema Challenge (WCS)

Let's fill a blank

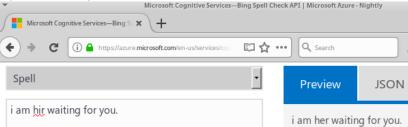
The city councilmen refused the demonstrators a permit because they [] violence.

A. feared

B. advocated

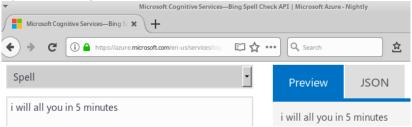
NLP is far from expectation

Spell checking is NLP.



NLP is far from expectation (circa. 2018)

Spell checking is NLP.



NLP in Al

- Alan Turing 1950 paper "Computing Machinery and Intelligence"
- Early sci-fi movies all have what today we call "question answering" (QA) or "automatic speech recognition" (ASR): Startrek communicator, 2001: A Space Odyssey (HAL can even read our lips!)
- Machine translation as at the center of early Al research
- ▶ "the spirit is willing but the flesh is weak" -> Russian and back -> "the vodka is good but the meat is rotten."
- Almost no Al funding by 1974 first Al winter.
- ➤ Reading assignment: "Technology; The Computer As Translator", New York Times, April 28, 1983. https://www.nytimes.com/1983/04/28/business/technology-the-computer-as-translator.html

American academia should stop chasing buzzwords and imminent applications

- Almost half a century later, after two AI winters, machine translation final becomes plausible.
- Automatic speech recognition (ASR) also comes into our daily life: Google Now, Amazon Alexa, Apple Siri, Microsoft Cortana, etc.
- Persistent research into neural networks (or in today's buzzword, "deep learning") made those task tractable.
- Ironically, "neural network" was almost dead in the US between mid 1990s and mid 2000s. Little funding. Few papers. Everyone was going after SVM.
- ► Hence, the deep learning wave started from Canada: Hinton (Toronto) and Y. Bengio (Montreal).
- Yann LeCun said in one of his Facebook posts that he was nobody until DL became popular.

Why NLP is hard

- Ambiguity 1:
 - "This book is mine."
 - "I live next to the coal mine."
 - "Millions of mines along the border is a result of the war."
- Ambiguity 2:
 - "You are so sweet."
 - "The soup is too sweet."
 - "Sweet, let's play the game!"
- Morphology
 - "Carbon dioxide" vs. CO2
 - "lowa State University" vs. "ISU"
 - "Step 1" vs. "First step"
- We are not aware that we know so much.
 - This guy has two legs. is it informative?

Typical tasks in or closely related to NLP (not mutually exclusive)

- Spell checking, next-work prediction
- Parsing and syntax
- Named entity recognition (NER)
- Relation/knowledge/information extraction, knowledge base/graph, e.g., MeasEval
- Information retrieval (historically considered a separate topic), e.g., Google search
- Semantics (you may count word embedding into this)
- ➤ Text classification (e.g., was this review helpful?)
- Machine translation
- Automatic summarization (abstractive and extractive)
- Question answering (QA)
- Machine Reading Comprehension (MRC)
- ► Text generation (a way to achieve many tasks aboves)
- Sentiment analysis
- Topic modeling

Rule-based vs. statistical NLP

- There are general two approaches to NLP problems: Rule-based (expert system) vs. statistical (machine learning).
- Tokenization is a typical task that rules may work without any problem.

```
>>> text = 'That U.S.A. poster-print costs $12.40...'
>>> pattern = r'''(?x)  # set flag to allow verbose regexps
...    ([A-Z]\.) +  # abbreviations, e.g. U.S.A.
... | \w+(-\w+) *  # words with optional internal hyphens
... | \$?\d+(\.\d+)?%?  # currency and percentages, e.g. $12.40
... | \\.\.  # ellipsis
... | [][.,;"'?():-_']  # these are separate tokens; includes ]
... '''
>>> nltk.regexp_tokenize(text, pattern)
['That', 'U.S.A.', 'poster-print', 'costs', '$12.40', '...']
```

- However, there are many cases that rules cannot cover varieties.
- ► There shouldn't be a clear distinction between the two approaches. For example, is BOW model rule-based or statistical?

KR needed in ML for NLP

Pure statistical language model is insufficient to judge whether the following statements makes a review helpful.

- "a waste of money"
- "Amazon shipping and return is so easy"
- "This car has 4 wheels"

NLP is language-dependent

- Some tasks are particularly difficult in some languages, e.g., segmentation in Chinese and Arabic.
- Some tasks are not "symmetric" between languages, e.g., in machine translation,
 - a sentence in Chinese may be required by grammar to be broken into multiple sentences in English, or
 - the order of phrases needs to be rearranged after translation.

Computational Linguistics or NLP?

- Apparently, mission-oriented research will not produce a long-lasting impact and/or a big breakthrough.
- "Physics is like sex." Richard Feynman.
- However, many problems in linguistics are not well defined, such as writing style. No ground truth. Hard to quantitatively measure.
- "To create an artificial being has been the dream of man since the birth of science."
- Computer science is about processing information, maybe for human use.
- Hence, the instructor prefer the name NLP over CL.

What I am working on in NLP

- Review analysis ("was this review helpful?", ACL 2015, ICTAI 2016, EACL 2017, NAACL 2018)
- Summarization (EACL 2017, and on going)
- Sentence purpose understanding (e.g., whether a sentence is about experimental conditions and yields, funded by NSF)

About the class

- Introductory: letting you know something about a lot of topics in NLP.
- NLP is so rapidly evolving so papers or online materials will be the main source of knowledge.
- No HW or exams to periodically push you to learn. Be self-motivated.
- Projects are optional. Bonus points. Potential papers.

Outline of the class

Let's go over the syllabus.

Prerequisite

- Linear algebra, calculus (up to multivariate calculus or calculus III), Probability theory – in era of deep learning, it is very hard to avoid such math basics.
- Machine Learning however, we will spend some time to cover due to different background of students.
- Computer programming, e.g., you can solve Leetcode easy-level problems under 10 minutes.
- The patience and desire to to think systematically and structurally