

**CSCI 544: Applied Natural Language Processing**

*Syllabus*

**Units:** 4

**Term — Day — Time:** Fall 2019- Wed. and Fri.  
8:00 am to 9:50am

**Location:** **SAL101**

**Instructor:** Anna Farzindar, Ph.D.

**Office:** GER 202B

**Regular Office Hours:** Wed. after class

**Contact Info:** [farzinda@usc.edu](mailto:farzinda@usc.edu)

**Catalogue Course Description**

Introduction to key components of human language technologies, including: information extraction, sentiment analysis, question answering, machine translation.

**Expanded Course Description**

The course will teach Natural Language processing algorithms. It will have an applied focus, in that it is meant for preparing students to utilize topics in NLP to solve real world problems.

This course is designed to introduce some of the problems and solutions of NLP, and their relation to linguistics and statistics. Students need to know how to program and use common data structures.

**Recommended Preparation**

A basic understanding engineering principles is required, including basic programming skills; familiarity with the Python language is desirable. Most assignments are designed for the Unix environment; basic Unix skills will make programming assignments much easier. Students will need sufficient mathematical background, including probability, statistics, and linear algebra. Some knowledge of machine learning is helpful, but not required.

**Course Notes**

The course will be run as a lecture class with student participation strongly encouraged. There are weekly readings and students are encouraged to do the readings prior to the discussion in class. All of the course materials, including the readings, lecture slides, home works will be posted online on USC Blackboard.

**Technological Proficiency and Hardware/Software Required**

Students are expected to know how to program in a language such as Python. Students are also expected to have their own laptop or desktop computer where they can install and run software to do the weekly homework assignments.

### Required Readings and Supplementary Materials

- o None required; *Speech and Language Processing, 2nd Edition* is optional but out of date <https://web.stanford.edu/~jurafsky/slp3/>
  - o <https://www.amazon.com/Speech-Language-Processing-Daniel-Jurafsky/dp/0131873210/>
  - o The new version is preferred <https://web.stanford.edu/~jurafsky/slp3/ed3book.pdf>
- o [Manning & Schütze](#) (recommended)
- o Farzindar and Inkpen, [Natural Language Processing for Social Media, Second Edition](#)
- o All required readings from the textbooks and elsewhere will be listed in the syllabus.

In addition to the textbook, students may be given additional reading materials such as research papers. Students are responsible for all assigned reading assignments.

### Description and Assessment of Assignments

**Homework Assignments:** There will be 4 homework assignments and a final project. The assignments and final project must be done individually. Each assignment is graded on a scale of 0-100 and the specific rubric for each assignment is given in the assignment. Each submission will be checked for plagiarism.

### Grading Breakdown

**Quizzes:** There will be weekly quizzes based on the material from the week before. There is no mid-term for this class.

**Comprehensive Exam:** There will be an exam at the end of the semester covering all of the material covered in the class.

Grading Schema:

Quizzes	30%
Homework	40%
Comprehensive Exam	15%
NLP Project	15%
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Total	100%

Grades will range from A through F. The following is the breakdown for grading:

94 – 100 = A    74 – 77 = C

90 – 94 = A-    70 – 74 = C-

87 – 90 = B+    67 – 70 = D+

84 – 87 = B    64 – 67 = D

80 – 84 = B-    60 – 64 = D-

77 – 80 = C+    Below 60 is an F

### **Assignment Submission Policy**

Homework assignments are due at 11:59 pm on the due date and should be submitted in Blackboard. You can submit homework up to one week late, but you will lose 20% of the possible points for the assignment. After one week, the assignment cannot be submitted. Every student has FIVE free late days for the homework assignments. You can use these five days for any reason separately or together to avoid the late penalty. There will be no other extensions for any reason. You cannot use the free late days after the last day of the class.

## Schedule

**Warning:** The schedule below may change. Links to future lectures and assignments are just placeholders and will change.

Week	Wednesday	Friday	Suggested Reading
8/26	<b>Introduction</b> <ul style="list-style-type: none"> <li>□ Why is NLP hard?</li> <li>□ Levels of language</li> <li>□ NLP applications</li> <li>□ Random language via n-grams</li> </ul>	<b>Probability concepts</b> <ul style="list-style-type: none"> <li>□ Joint &amp; conditional prob</li> <li>□ Chain rule and backoff</li> <li>□ Modeling sequences</li> <li>□ Cross-entropy and perplexity</li> </ul>	<ul style="list-style-type: none"> <li>• Intro: J&amp;M chapter <a href="#">1</a></li> <li>• Chomsky hierarchy: J&amp;M 16</li> <li>• Prob/Bayes: M&amp;S <a href="#">2</a></li> </ul>
9/2	Assignment 1 given <b>Modeling grammaticality</b> <ul style="list-style-type: none"> <li>□ What's wrong with n-grams?</li> <li>□ Regular expressions, FSAs, CFGs, ...</li> </ul>	<b>N-gram language models</b> <ul style="list-style-type: none"> <li>□ Language ID</li> <li>□ Text categorization</li> <li>□ Spelling correction</li> <li>□ Segmentation</li> <li>□ Speech recognition</li> <li>□ Machine translation</li> </ul>	<ul style="list-style-type: none"> <li>• Language models: J&amp;M <a href="#">3</a></li> <li>• <a href="#">Huddleston</a></li> </ul>
9/9	<b>Bayes' Theorem and Smoothing n-grams</b>	<i>Assignment 1 Given (Sep 13th)</i>	<ul style="list-style-type: none"> <li>□ Smoothing: J&amp;M <a href="#">3</a> <a href="#">4</a>; <a href="#">Rosenfeld (2000)</a></li> </ul>

	<input type="checkbox"/> Maximum likelihood estimation <input type="checkbox"/> Bias and variance <input type="checkbox"/> Add-one or add- $\lambda$ smoothing <input type="checkbox"/> Cross-validation <input type="checkbox"/> Smoothing with backoff <input type="checkbox"/> Good-Turing, Witten-Bell	<b>Intro to neural language Models</b> <input type="checkbox"/> Conditional log-linear models <input type="checkbox"/> Maximum likelihood, regularization <input type="checkbox"/> Feedforward neural language Models <input type="checkbox"/> Recurrent neural language Models	<input type="checkbox"/> Log-linear models: <a href="#">Collins</a> (pp. 1-4)
9/16	Guest Lecture or applied NLP (TBD)	Language Models <b>Context-free parsing</b> <input type="checkbox"/> What is parsing? <input type="checkbox"/> Why is it useful? <input type="checkbox"/> Brute-force algorithm <input type="checkbox"/> <a href="#">CKY and Earley algorithms</a>	<input type="checkbox"/> Attributes: J&M 15 <input type="checkbox"/> Parsing: J&M 13
9/23	<i>Assignment 1 due (Sep 23rd)</i> <b>Earley's algorithm</b> <input type="checkbox"/> Top-down parsing <input type="checkbox"/> Earley's algorithm	<i>Assignment 2 Given (Sep 27th)</i> <b>Probabilistic parsing</b> <input type="checkbox"/> PCFG parsing	<input type="checkbox"/> CCG: <a href="#">Steedman &amp; Baldridge</a> ; <a href="#">more</a> <input type="checkbox"/> TAG/TSG: <a href="#">Van Noord</a> , Guo, Zhang <a href="#">1/2/3</a> <input type="checkbox"/> Prob. parsing: J&M 14

		<input type="checkbox"/> Dependency grammar <input type="checkbox"/> Lexicalized PCFGs	
9/30	NLP for Social media	<i>Student project presentation (NLP for Social media)</i>	Farzindar and Inkpen, <a href="#">Natural Language Processing for Social Media, Second Edition</a>
10/7	<i>Assignment 2 due (Oct 7th)</i> <b>Semantics</b> <input type="checkbox"/> What is understanding? <input type="checkbox"/> Lambda terms <input type="checkbox"/> Semantic phenomena and representations <input type="checkbox"/> More semantic phenomena and representations	<b>Distributional semantics</b> (word embeddings) <input type="checkbox"/> Compositional semantics <input type="checkbox"/> Distributional semantics	<input type="checkbox"/> Semantics: J&M 17-18; up to but not including "denotational semantics" section; <a href="#">lambda calculus for kids</a> <input type="checkbox"/> Forward-backward: J&M 6
10/14	<i>Project proposal due</i> Assignment 3 given: Semantics <b>Sequence tagging models</b> ( <a href="#">Excel spreadsheet</a> ; <a href="#">Viterbi version</a> ; <a href="#">lesson plan</a> ; <a href="#">video lecture</a> ) <input type="checkbox"/> Ice cream, weather, words and tags <input type="checkbox"/> Forward and backward probabilities <input type="checkbox"/> Inferring hidden states	No class (fall break)	

	<input type="checkbox"/> Likelihood convergence <input type="checkbox"/> Local maxima		
10/21	<b>Assignment 3 Given (Oct 21)</b> <b>Expectation Maximization</b> <input type="checkbox"/> Generalizing the forward-backward strategy <input type="checkbox"/> Inside- outside algorithm <input type="checkbox"/> Posterior decoding	<b>Neural sequence tagging models</b> <input type="checkbox"/> Recurrent Neural Networks <input type="checkbox"/> Conditional Random Fields <input type="checkbox"/> Neural CRFs	<input type="checkbox"/> Inside-outside and EM: J <a href="#">relation to backprop</a>
10/28	Neural Sequence Tagging Guest Lecture (TBD)	<b>Assignment 3 due (Nov 1)</b> <b>Text classification</b> <input type="checkbox"/> Features <input type="checkbox"/> Linear Classifiers	
11/4	<b>Project proposal revision (if applicable) due</b> <b>Assignment 4 Given (Nov 6th)</b> Guest Lecture or applied NLP (TBD)	<b>Neural text classification</b> <input type="checkbox"/> CNN <input type="checkbox"/> LSTM <input type="checkbox"/> Contextualized Embeddings	
11/11	<b>Morphology and phonology</b> <input type="checkbox"/> Stemming <input type="checkbox"/> Compounds, segmentation	<b>Assignment 4 due (Nov 15th)</b> <b>Multilinguality and machine translation</b>	<input type="checkbox"/> Morphology: R&S 2

	<input type="checkbox"/> Two-level morphology <input type="checkbox"/> Punctuation <input type="checkbox"/> Rewrite rules	<input type="checkbox"/> Intro to MT <input type="checkbox"/> Evaluations	
11/18	<b>Sequence to sequence models</b> <input type="checkbox"/> RNN-based seq-to-seq models <input type="checkbox"/> Transformers <input type="checkbox"/> Applications to machine translation, summarization.	<b>Current NLP tasks and competitions</b> <input type="checkbox"/> The NLP research community <input type="checkbox"/> Machine Translation <input type="checkbox"/> Question Answering <input type="checkbox"/> Dialog Systems	<input type="checkbox"/> MT: J&M 25, M&S <a href="#">13</a> , <a href="#">statmt.org</a> ; <a href="#">tutorial</a> (2003), <a href="#">workbook</a> (1999), <a href="#">introductory essay</a> (1997), <a href="#">technical paper</a> (1993); tutorial (2006) focusing on more recent developments ( <a href="#">slides</a> , 3-hour video <a href="#">part 1</a> , <a href="#">part 2</a> )
11/25	<b>No class</b> (Thanksgiving break)	<b>No class</b> (Thanksgiving break)	
12/2	<b>Applied NLP continued</b>	<b>Comprehensive exam <a href="#">December 6th</a></b> <i>Project final due</i> <i>Wednesday, December 11</i>	

## Statement on Academic Conduct and Support Systems

### Academic Conduct

Plagiarism – presenting someone else’s ideas as your own, either verbatim or recast in your own words – is a serious academic offense with serious consequences. Please familiarize yourself with the discussion of plagiarism in *SCampus* in Section 11, *Behavior Violating University Standards* <https://policy.usc.edu/student/scampus/part-b/>. Other forms of academic dishonesty



are equally unacceptable. See additional information in *SCampus* and university policies on scientific misconduct, <http://policy.usc.edu/scientific-misconduct>.

Discrimination, sexual assault, and harassment are not tolerated by the university. You are encouraged to report any incidents to the *Office of Equity and Diversity* <http://equity.usc.edu> or to the *Department of Public Safety*

<http://adminopsnet.usc.edu/departments/departments-public-safety>. This is important for the safety of the whole USC community. Another member of the university community – such as a friend, classmate, advisor, or faculty member – can help initiate the report, or can initiate the report on behalf of another person. *The Relationship and Sexual Violence Prevention Services* <http://engemannshc.usc.edu/rsvp/> provides 24/7 confidential support, and the sexual assault resource center webpage <http://sarc.usc.edu> describes reporting options and other resources.

### ***Support Systems***

A number of USC's schools provide support for students who need help with scholarly writing. Check with your advisor or program staff to find out more. Students whose primary language is not English should check with the *American Language Institute* <http://dornsife.usc.edu/ali>, which sponsors courses and workshops specifically for international graduate students. *The Office of Disability Services and Programs*

[http://sait.usc.edu/academicsupport/centerprograms/dsp/home\\_index.html](http://sait.usc.edu/academicsupport/centerprograms/dsp/home_index.html) provides certification for students with disabilities and helps arrange the relevant accommodations. If an officially declared emergency makes travel to campus infeasible, *USC Emergency Information* <http://emergency.usc.edu> will provide safety and other updates, including ways in which instruction will be continued by means of blackboard, teleconferencing, and other technology.

### ***Resources for Online Students***

The Course Blackboard page has many resources available for students enrolled in our graduate programs. In addition, all registered students can access electronic library resources through the link <https://libraries.usc.edu/>.