### **Grammar Induction**

### **General Information**

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#### Course Outline

Conventional syntactic theories assume a structure inherent in natural language which is innate, i.e. known *a priori* by a human learner. Much work in computational linguistics has thus dealt with the formal characterization and implementation of such hypothesized innate linguistic knowledge. In this course, we will focus instead on *a posteriori* ("unsupervised") approaches to language learning which assume minimal (if any) prior knowledge on the part of the learner.

After a brief review of the basics of probability and information theory, we will discuss several alternative theoretical learning paradigms and their relevance to natural language induction. The second phase of the course will be concerned with the induction of lexical (syntactic) categories by means of *clustering*. The remainder of the course will focus on the unsupervised acquisition of *language models* – in particular stochastic finite state automata and stochastic context-free grammars – by means of expectation-maximization, genetic algorithms, alignment-based learning, and additional linguistically-oriented algorithms.

### **Course Requirements**

- In-class presentation **and** written paper are required for acquisition of a *Schein*.
- Topics for in-class presentations, papers, and programming projects must be arranged with me.
- Students presenting a topic in class must meet with me to discuss the respective topic at least one week before the presentation is scheduled.

## Course Syllabus

Week	Date	Topic(s)	Reading
1	14.04.	Administrivia	
2	21.04.	Probability Theory	Manning and Schütze
			(1999, Ch. 1, 2.1)
3	28.04.	Information Theory	Manning and Schütze
			(1999, Ch. 2.2)
4	05.05.	no class	
5	12.05.	Learnability	Gold $(1967);$
			Angluin and Smith
			(1983); Valiant $(1984)$
6	19.05.	Lexical Categories 1	Brown et al. $(1992)$
7	26.05.	Lexical Categories 2	Finch and Chater
			(1993); Roberts $(2002)$
8	02.06.	RLs: EM	Manning and Schütze
			(1999,  Ch. 9);
			Vidal et al. $(2004a,b)$
9	09.06.	RLs: ALGERIA, RLIPS	Carrasco and Oncina
			(1994, 1999)
10	16.06.	RLs: MDI, MALGERIA	Thollard et al. $(2000);$
			Habrard et al. $(2003)$
11	23.06.	CFLs: EM	Manning and Schütze
			(1999, Ch. 11); Charniak
			(1993, Ch. 6,7)
12	30.06.	CFLs: GAs	Lankhorst (1994)
13	07.07.	CFLs: ABL	van Zaanen (2000)
14	14.07.	CFLs: DGs	Klein and Manning
			(2004)

# References

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