# LING254: Topics in Linguistics; Models of Syntax Learning and Learnability Winter 2021

Instructor: Laurel Perkins (she/her), <u>perkinsl@ucla.edu</u> Time: M/W 10:00am-12:00pm, via Zoom

### **Course Description**

This proseminar will discuss models of early syntax acquisition from two different literatures: language acquisition/learnability models in linguistics, and statistical/distributional learning models in computational cognitive science. These literatures have historically made different assumptions about the roles of prior knowledge and mechanisms for learning from data in the early stages of acquiring a grammar. Parameter-setting and other learnability models in linguistics traditionally conceive of learning as mapping input to a rich hypothesis space of possible grammars or grammatical primitives, in order to identify a specific grammar for the language of experience. A challenge for these models is explaining how learners use their data in this process: these grammatical hypotheses make predictions at the level of abstract categories and dependencies, but learners must identify the specific expression of these categories and dependencies in their input. Distributional and statistical learning models traditionally conceive of learning as a process of gradual generalization from highly specific representations to more abstract ones. A challenge for these models is specifying the biases that allow learners to generalize in the right way in the face of indeterminate evidence, and arrive at the rich grammatical knowledge that mature speakers demonstrate.

Our goals in this course are to bring these approaches in conversation with each other, ask how they relate to empirical developmental findings, and ask how they might jointly inform our theories of grammar development. We will focus on models investigating the basic syntactic phenomena acquired very early in development: grammatical categories, word order, argument structure, phrase structure, and movement dependencies. Although syntax will be the case study, this proseminar is intended to be broadly accessible to anyone interested in bringing computational models to bear on language acquisition theories. No prior background in computation is needed; we'll discuss the relevant computational approaches as we go.

#### **Course Website**

The course schedule and readings will be made available on the course CCLE page.

#### **Course Requirements**

- For **2 credits**: class participation and paper presentation (100%)
- For 4 credits: class participation and paper presentation (50%), final paper (50%)

# **Class Participation and Paper Presentation**

This a discussion-based seminar, which means you'll be asked to participate actively in class. This requires thoroughly reading and digesting the assigned readings ahead of time, and being prepared to discuss your thoughts and questions about those readings. Zoom is not an ideal medium, but we'll work together to make it a supportive environment for productive discussion. Turning on your camera whenever possible will make a huge difference to facilitate this (and will make class a more rewarding social experience!), but the chat function can also be used if that option isn't available for you. All discussion is expected to be respectful and inclusive towards the different identities, backgrounds, and perspectives of your fellow students and me.

Once during the quarter, you will also be asked to lead class discussion (alone or in pairs) on one of the assigned or optional readings. You should aim to briefly summarize for us the paper's key points and findings, and provide a few critical questions for discussion fodder.

# **Final Paper**

Students taking the course for 4 credits will write a short paper (about 8-12 pages, double-spaced) on a topic relevant to the course. The parameters for this paper are flexible. Some possible ideas:

- Proposing a specific way to extend an existing model to account for a different linguistic phenomenon, or to test different assumptions about learning
- Implementing a mini version of an existing or new model in a particular learning domain
- Critically reviewing a body of computational literature in order to highlight what specific questions it addresses and how it bears on broader questions in language acquisition theory

A one-page proposal (a brief description of the topic you have chosen and a list of references) is due on **Feb. 10**. You are strongly encouraged to schedule appointments with me throughout the quarter to discuss topic ideas and receive feedback on your proposal or your work in progress. During the last week of class, you will give a brief presentation of your paper to the rest of the class. Final papers are due on **Mar. 17**.

### **Course Schedule**

Here's a tentative schedule of topics and readings, subject to change and reorganization.

Week	Date	Торіс	Readings
1	1/4 1/6	Introduction: learning & learnability	J.A. Fodor 1966; Gallistel 2006; Morgan 1986 Ch. 2 (optional: Chomsky & Fodor in Piatelli-Palmerini 1980)
2	1/11 1/13	Parameters	J.D. Fodor 1998; Sakas 2016 (optional: Gibson & Wexler, 1994)
3	1/18	No class: MLK Day	
	1/20	Parameters	Yang 2002 Ch. 2; Legate & Yang 2007
4	1/25 1/27	Semantic & syntactic bootstrapping	Pinker 1984 Ch. 2; Gleitman 1990; Abend et al. 2017 (optional: Pearl & Goldwater 2016)
5	2/1 2/3	Argument structure	Perfors, Tenenbaum & Wonnacott, 2010; Perkins, Feldman, & Lidz under review (optional: Russell & Norvig 2010, Chs. 13-14)
6	2/8 2/10	Categories	Redington, Chater, & Finch 1998; Mintz 2003 (optional: Cartwright & Brent 1997; Chemla et al. 2009)
7	2/15	No class: Presidents' Day	
	2/17	Prosodic bootstrapping	Christophe et al. 2008; Gutman et al. 2015
8	2/22 2/24	Phrases	Thompson & Newport 2007; Saffran 2001; selections from McCauley & Christiansen 2019
9	3/1 3/3	Dependencies	Wang, Zevin & Mintz 2019; Perkins & Lidz, under review; Stabler 1998 (optional: Perkins 2019, Ch. 5)
10	3/8 3/10	Statistical learning & UG, paper presentations	Perfors, Tenenbaum & Reiger 2011; Berwick et al. 2011 (optional: Clark & Eyraud 2006; Lidz & Gagliardi 2015)

#### Course Procedures and Policies Academic Integrity

All members of the UCLA academic community are expected to maintain standards of academic honesty, specified by the <u>UCLA Student Conduct Code</u>. It is important for you to know what constitutes improper academic conduct and the consequences for this misconduct. What academic integrity means in the context of this course: students are permitted, and indeed encouraged, to discuss course material and assignments together. However, all work you submit in this course must be written by you individually, in your own words. Ideas of other authors that we are reading in this course, or that you read on your own, must be properly cited. Any idea or information that is not cited is assumed to be your individual contribution; otherwise it is plagiarism. If you're having any trouble understanding material or are experiencing any extenuating circumstances that are affecting your ability to participate in class or keep up with assignments, please reach out to me and I will be more than happy to help.

### **Diversity and Self-Identification**

It is my intent that students from all backgrounds and perspectives be well served by this course and that the diversity that students bring to this class be viewed as a resource and strength. I am committed to fostering a learning environment that honors your identities, including race, ethnicity, gender, sexuality, religion, national origin, age, and dis/ability. Presented materials and discussion are meant to be respectful of diversity and different identities. Your suggestions are encouraged and appreciated. Please let me know of ways to improve the effectiveness of the course for you personally or for other students or groups.

I invite you to tell us how you want to be referred to both in terms of your names and your pronouns. All aspects of your identity are your choice to disclose and should be self-identified, not presumed or imposed. I will do my best to address and refer to all students accordingly, and I ask you to do the same for your fellow colleagues.

# Students with Disabilities

Students needing academic accommodations should contact the Center for Accessible Education (CAE) at please <u>caeintake@saonet.ucla.edu</u> or (310) 825-1501. When possible, students should contact the CAE within the first two weeks of the term as reasonable notice is needed to coordinate accommodations. For more information, visit <u>www.cae.ucla.edu</u>.

# Mental Health and Student Support

Graduate school can be difficult, and many students find themselves struggling at some time or another. But you don't need to struggle alone: there are many people at this university whose job it is to help students with all kinds of circumstances. Some of these resources include <u>Counseling and Psychological</u> <u>Services (CAPS)</u>, the <u>Ashe Student Health and Wellness Center</u>, the <u>Consultation and Response Team</u>, the office of <u>Equity</u>, <u>Diversity and Inclusion</u>. If you are experiencing challenges that are having an impact on your participation in this course, please talk to me and we can work together to create a plan. If you're not comfortable talking to me directly, please reach out to an advisor in the department or to other support services on campus.

#### References

- Abend, Omri, Tom Kwiatkowski, Nathaniel J. Smith, Sharon Goldwater, and Mark Steedman. "Bootstrapping Language Acquisition." *Cognition* 164 (2017): 116–43.
- Alishahi, Afra, and Suzanne Stevenson. "A Computational Model of Early Argument Structure Acquisition." Cognitive Science 32, no. 5 (2008): 789–834.
- Aslin, Richard N., and Elissa L. Newport. "Statistical Learning: From Acquiring Specific Items to Forming General Rules." *Current Directions in Psychological Science* 21, no. 3 (2012): 170–76.
- Beekhuizen, Barend, Rens Bod, Afsaneh Fazly, Suzanne Stevenson, and Arie Verhagen. "A Usage-Based Model of Early Grammatical Development." In Proceedings of the Fifth Workshop on Cognitive Modeling and Computational Linguistics, 46–54, 2014.
- Berwick, Robert C. The Acquisition of Syntactic Knowledge. MIT Press, 1985.
- Berwick, Robert C., Paul Pietroski, Beracah Yankama, and Noam Chomsky. "Poverty of the Stimulus Revisited." *Cognitive Science* 35, no. 7 (2011): 1207–42.
- Chater, Nick, and Christopher D. Manning. "Probabilistic Models of Language Processing and Acquisition." *Trends in Cognitive Sciences* 10, no. 7 (2006): 335–44.
- Cartwright, Timothy A., and Michael R. Brent. "Syntactic Categorization in Early Language Acquisition: Formalizing the Role of Distributional Analysis." *Cognition* 63, no. 2 (1997): 121–70.
- Chemla, Emmanuel, Toben H. Mintz, Savita Bernal, and Anne Christophe. "Categorizing Words Using 'Frequent Frames': What Cross-Linguistic Analyses Reveal about Distributional Acquisition Strategies." *Developmental Science* 12, no. 3 (2009): 396–406.
- Chomsky, Noam. Aspects of the Theory of Syntax. Cambridge, MA: MIT Press, 1965.
- Chomsky, Noam. "On Cognitive Structures and Their Development: A Reply to Piaget." In Language and Learning: The Debate between Jean Piaget and Noam Chomsky, edited by Massimo Piatelli-Palmarini, 35–54. Cambridge, MA: Harvard University Press, 1980.
- Chomsky, Noam. Reflections on Language. New York, NY: Pantheon, 1975.
- Christophe, Anne, Séverine Millotte, Savita Bernal, and Jeffrey Lidz. "Bootstrapping Lexical and Syntactic Acquisition." *Language and Speech* 51, no. 1–2 (March 1, 2008): 61–75.
- Clark, Alexander, and Rémi Eyraud. "Learning Auxiliary Fronting with Grammatical Inference." In Proceedings of the Tenth Conference on Computational Natural Language Learning (CoNLL-X), 125–32, 2006.
- Clark, Alexander, and Shalom Lappin. "Computational Learning Theory and Language Acquisition." In *Handbook* of *Philosophy of Linguistics*, edited by Ruth Kempson, Nicholas Asher, and Tim Fernando. Oxford, UK: Elsevier, 2012.
- Clark, Alexander, and Ryo Yoshinaka. "Distributional Learning of Context-Free and Multiple Context-Free Grammars." In *Topics in Grammatical Inference*, edited by J. Heinz and J.M. Sempere, 143–72. Springer-Verlag Berlin Heidelberg, 2016.
- Clark, Robin. "The Selection of Syntactic Knowledge." Language Acquisition 2, no. 2 (1992): 83-149.
- Connor, Michael, Cynthia Fisher, and Dan Roth. "Starting from Scratch in Semantic Role Labeling: Early Indirect Supervision." In *Cognitive Aspects of Computational Language Acquisition*, 257–96. Springer, 2013.
- Fisher, Cynthia, Yael Gertner, Rose M. Scott, and Sylvia Yuan. "Syntactic Bootstrapping." *Wiley Interdisciplinary Reviews: Cognitive Science* 1, no. 2 (2010): 143–49.
- Fodor, Janet Dean. "Parsing to Learn." Journal of Psycholinguistic Research 27, no. 3 (1998): 339-74.
- Fodor, Jerry A. "How to Learn to Talk: Some Simple Ways." In *The Genesis of Language: A Psycholinguistic Approach*, edited by F. Smith and G. A. Miller, 105–22. Cambridge, MA: MIT Press, 1966.
- Fodor, Jerry A. "On the Impossibility of Acquiring 'More Powerful' Structures." In Language and Learning: The Debate between Jean Piaget and Noam Chomsky, edited by Massimo Piatelli-Palmarini, 142–62. Cambridge, MA: Harvard University Press, 1980.
- Fong, Sandiway, and Robert C. Berwick. "Treebank Parsing and Knowledge of Language: A Cognitive Perspective." In *Proceedings of the Annual Meeting of the Cognitive Science Society*, Vol. 30, 2008.
- Gallistel, C. R. "L'apprentissage de Matières Distinctes Exige Des Organes Distincts / Learning Organs." In *Cahier* N° 88: Noam Chomsky, edited by J. Bricmont and J. Franck, 181–87. Paris: L'Herne, 2006.
- Gibson, Edward, and Kenneth Wexler. "Triggers." Linguistic Inquiry 25, no. 3 (1994): 407-54.

Gillette, Jane, Henry Gleitman, Lila Gleitman, and Anne Lederer. "Human Simulations of Vocabulary Learning." Cognition 73, no. 2 (1999): 135–76.

- Gleitman, Lila R. "The Structural Sources of Verb Meanings." Language Acquisition 1, no. 1 (1990): 3-55.
- Gutman, Ariel, Isabelle Dautriche, Benoît Crabbé, and Anne Christophe. "Bootstrapping the Syntactic Bootstrapper: Probabilistic Labeling of Prosodic Phrases." *Language Acquisition* 22, no. 3 (2015): 285–309.
- Hyams, Nina. Language Acquisition and the Theory of Parameters. Dordrecht: D. Reidel, 1986.
- Hyams, Nina. "Missing Subjects in Early Child Language." In *Handbook of Generative Approaches to Language Acquisition*, edited by Jill G. De Villiers and Thomas Roeper, 13–52. Springer, 2011.
- Kam, Xuân-Nga Cao, Iglika Stoyneshka, Lidiya Tornyova, Janet D. Fodor, and William G. Sakas. "Bigrams and the Richness of the Stimulus." *Cognitive Science* 32, no. 4 (2008): 771–87.
- Klein, Dan, and Christopher D. Manning. "Corpus-Based Induction of Syntactic Structure: Models of Dependency and Constituency." In Proceedings of the 42nd Annual Meeting of the Association for Computational Linguistics (ACL-04), 478–85, 2004.
- Legate, Julie Anne, and Charles Yang. "Morphosyntactic Learning and the Development of Tense." *Language Acquisition* 14, no. 3 (2007): 315–44.
- Lidz, Jeffrey, and Annie Gagliardi. "How Nature Meets Nurture: Universal Grammar and Statistical Learning." *Annu. Rev. Linguist.* 1, no. 1 (2015): 333–53.
- Lightfoot, David. How to Set Parameters: Arguments from Language Change. Cambridge, MA: MIT Press, 1991.
- Manzini, M. Rita, and Kenneth Wexler. "Parameters, Binding Theory, and Learnability." *Linguistic Inquiry* 18, no. 3 (1987): 413–44.
- Maurits, Luke, A. Perfors, and D. Navarro. "Joint Acquisition of Word Order and Word Reference." In *Proceedings* of the 31st Annual Conference of the Cognitive Science Society, 2009.
- McCauley, Stewart M., and Morten H. Christiansen. "Language Learning as Language Use: A Cross-Linguistic Model of Child Language Development." *Psychological Review* 126, no. 1 (2019): 1.
- Mintz, Toben H. "Frequent Frames as a Cue for Grammatical Categories in Child Directed Speech." *Cognition* 90, no. 1 (2003): 91–117.
- Mintz, Toben H., Elissa L. Newport, and Thomas G. Bever. "The Distributional Structure of Grammatical Categories in Speech to Young Children." *Cognitive Science* 26, no. 4 (2002): 393–424.
- Morgan, James L. From Simple Input to Complex Grammar. Cambridge, MA: MIT Press, 1986.
- Morgan, James L., and Katherine Demuth, eds. *Signal to Syntax: Bootstrapping from Speech to Grammar in Early Acquisition*. Lawrence Erlbaum, 1996.
- Newport, Elissa L., and Richard N. Aslin. "Learning at a Distance: Statistical Learning of Non-Adjacent Dependencies." *Cognitive Psychology* 48, no. 2 (2004): 127–62.
- Niyogi, Sourabh. "Bayesian Learning at the Syntax-Semantics Interface." In *Proceedings of the Annual Meeting of the Cognitive Science Society*, Vol. 24, 2002.
- Niyogi, Partha, and Robert C. Berwick. "A Language Learning Model for Finite Parameter Spaces." *Cognition* 61, no. 1–2 (1996): 161–93.
- Parisien, Christopher, Afsaneh Fazly, and Suzanne Stevenson. "An Incremental Bayesian Model for Learning Syntactic Categories." In CoNLL 2008: Proceedings of the Twelfth Conference on Computational Natural Language Learning, 89–96, 2008.
- Parisien, Christopher, and Suzanne Stevenson. "Learning Verb Alternations in a Usage-Based Bayesian Model." In *Proceedings of the Annual Meeting of the Cognitive Science Society*, Vol. 32, 2010.
- Pearl, Lisa S., and Jon Sprouse. "Comparing Solutions to the Linking Problem Using an Integrated Quantitative Framework of Language Acquisition." *Language* 95, no. 4 (2019).
- Pearl, Lisa, and Sharon Goldwater. "Statistical Learning, Inductive Bias, and Bayesian Inference in Language Acquisition." In *The Oxford Handbook of Developmental Linguistics*, edited by Jeffrey Lidz, William Snyder, and Joe Pater. Oxford, UK: Oxford University Press, 2016.
- Perfors, Andrew, Joshua B. Tenenbaum, and Terry Regier. "Poverty of the Stimulus? A Rational Approach." In *Proceedings of the Cognitive Science Society*, Vol. 28, 2006.

- Perfors, Andrew, Joshua B. Tenenbaum, and Elizabeth Wonnacott. "Variability, Negative Evidence, and the Acquisition of Verb Argument Constructions." *Journal of Child Language* 37, no. 3 (2010): 607–42.
- Perkins, Laurel. "How Grammars Grow: Argument Structure and the Acquisition of Non-Basic Syntax." Doctoral dissertation, University of Maryland, 2019.
- Perkins, Laurel, Naomi H. Feldman, and Jeffrey Lidz. "The Power of Ignoring: Filtering Input for Argument Structure Acquisition," under review.
- Perkins, Laurel, and Jeffrey Lidz. "Grammatical Action at a Distance: Non-Local Syntactic Dependencies in 18-Month-Old Infants," under review.
- Pinker, Steven. "Formal models of language learning." Cognition 7 (1979), 217-283.
- Pinker, Steven. Language Learnability and Language Development. Cambridge, MA: Harvard University Press, 1984.
- Pinker, Steven. *Learnability and Cognition: The Acquisition of Argument Structure*. Cambridge, MA: MIT Press, 1989.
- Reali, Florencia, and Morten H. Christiansen. "Uncovering the Richness of the Stimulus: Structure Dependence and Indirect Statistical Evidence." *Cognitive Science* 29, no. 6 (2005): 1007–28.
- Redington, Martin, Nick Chater, and Steven Finch. "Distributional Information: A Powerful Cue for Acquiring Syntactic Categories." *Cognitive Science* 22, no. 4 (1998): 425–69.
- Russell, Stuart J., and Peter Norvig. *Artificial Intelligence: A Modern Approach, Third International Edition*. Pearson Education London, 2010.
- Saffran, Jenny R. "The Use of Predictive Dependencies in Language Learning." *Journal of Memory and Language* 44, no. 4 (2001): 493–515.
- Saffran, J. R., R. N. Aslin, and E. L. Newport. "Statistical Learning by 8-Month-Old Infants." *Science (New York, N.Y.)* 274, no. 5294 (1996): 1926–28.
- Sakas, William. "Computational Approaches to Parameter Setting in Generative Linguistics." In *The Oxford Handbook of Developmental Linguistics*, edited by Jeffrey Lidz, William Snyder, and Joe Pater. Oxford, UK: Oxford University Press, 2016.
- Sakas, William, and Janet Dean Fodor. "Disambiguating Syntactic Triggers." *Language Acquisition* 19, no. 2 (2012): 83–143.
- Sakas, William, and Janet Dean Fodor. "The Structural Triggers Learner." In *Language Acquisition and Learnability*, edited by Stefano Bertolo, 172–233. Cambridge: Cambridge University Press, 2001.
- Siskind, Jeffrey Mark. "A Computational Study of Cross-Situational Techniques for Learning Word-to-Meaning Mappings." *Cognition* 61, no. 1–2 (1996): 39–91.
- Stabler, Edward P. "Acquiring Languages with Movement." Syntax 1, no. 1 (1998): 72-97.
- Takahashi, Eri. "Beyond Statistical Learning in the Acquisition of Phrase Structure." Doctoral dissertation, University of Maryland, 2009.
- Takahashi, Eri, and Jeffrey Lidz. "Beyond Statistical Learning in Syntax." In *Proceedings of Generative Approaches to Language Acquisition*, 2008.
- Thompson, Susan P., and Elissa L. Newport. "Statistical Learning of Syntax: The Role of Transitional Probability." *Language Learning and Development* 3, no. 1 (2007): 1–42.
- Van Schijndel, Marten, and Micha Elsner. "Bootstrapping into Filler-Gap: An Acquisition Story." In *Proceedings of the 52nd Annual Meeting of the Association for Computational Linguistics*, 1084–93, 2014.
- Wang, Felix Hao, Jason Zevin, and Toben H. Mintz. "Successfully Learning Non-Adjacent Dependencies in a Continuous Artificial Language Stream." Cognitive Psychology 113 (2019): 101223.
- Wexler, Kenneth, and Peter Culicover. *Formal Principles of Language Acquisition*. Cambridge, MA: MIT Press, 1980.
- Wilson, Benjamin, Michelle Spierings, Andrea Ravignani, Jutta L. Mueller, Toben H. Mintz, Frank Wijnen, Anne Van der Kant, Kenny Smith, and Arnaud Rey. "Non-Adjacent Dependency Learning in Humans and Other Animals." *Topics in Cognitive Science* 12, no. 3 (2020): 843–58.
- Yang, Charles. Knowledge and Learning in Natural Language. Oxford: Oxford University Press, 2002.