

# Psych156A/Ling150: Psychology of Language Learning

## Lecture 16 Learning Biases

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### Announcements

Final, 6/12/08 in SH 134, 4pm-6pm:

Will be closed-note. Questions will come *only* from quizzes and homeworks. (No surprises.)

Final paper: Due by 6pm on 6/12/08. Hand in hard copy during final exam, or email me ([lpearl@uci.edu](mailto:lpearl@uci.edu)) in either .doc or .pdf format. Email me by next Thursday (5/29/08) if you will be writing a final paper, and indicate which article(s) you will be writing a review of. If I do not receive email from you, I will assume you will be taking the final exam.

HW 6 assigned today, due next Thursday (5/29/08)  
Quiz 6 on Tuesday (5/27/08)

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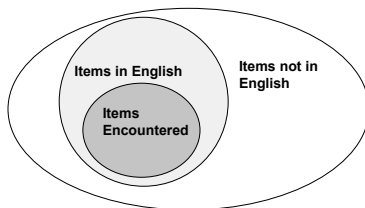
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### Summary from last time: Poverty of the Stimulus and Learning Strategies

Poverty of the stimulus: Children will often be faced with multiple generalizations that are compatible with the language data they encounter. In order to learn their native language, they must choose the correct generalizations.



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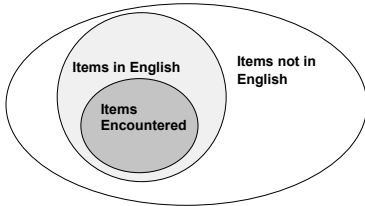
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Summary from last time:  
Poverty of the Stimulus and Learning Strategies

Claim of prior (innate) knowledge: Children only seem to make the right generalization. This suggests *something* biases them to make that generalization over other possible generalizations. Importantly, that *something* isn't available in the data itself. It is knowledge they must already know to succeed at learning language.



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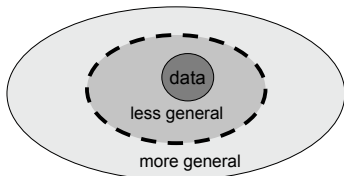
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Summary from last time:  
Poverty of the Stimulus and Learning Strategies

One Learning Bias: Experimental research on artificial languages suggests that children prefer the more conservative generalization compatible with the data they encounter.



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Specificity of Innate Knowledge

"Innate capacities may take the form of biases or sensitivities toward particular types of information inherent in environmental events such as language, rather than a priori knowledge of grammar itself." - Seidenberg (1997)

Example: Children seem able to calculate transitional probabilities across syllables (Saffran, Aslin, & Newport 1996).

Example: Adults seem able to calculate transitional probabilities across grammatical categories (Thompson & Newport 2007)

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**But is it always  
just statistical information of some kind?**

Gambell & Yang (2006) found that tracking transitional probabilities across syllables yields very poor word segmentation on realistic English data.

Other learning strategies like the Unique Stress Constraint and algebraic learning did far better. These other learning strategies were not statistical in nature - they did not use probabilistic information.

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**Peña et al. 2002: Experimental Study**

Goal: examine the relation between statistical learning mechanisms and non-statistical learning mechanisms like algebraic learning.

Adult learners' task on artificial language:

- (1) word segmentation
- (2) generalization about words (~categorization)

PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

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**Peña et al. 2002: Experimental Study**

The artificial language: "AXC language"

Syllables: A, X, C

Generalization:

A perfectly predicts C: A\_C is a word in the language  
pu\_ki, be\_ga, ta\_du

Intervening syllable X: \_ra\_, \_li\_, \_fo\_

pu ra ki be li ga ta fo du pu fo ki ta li du be ra ga ...  
PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

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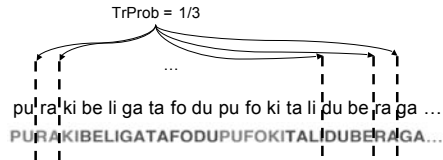
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### Peña et al. 2002: Experimental Study

The artificial language: "AXC language"

Note: transitional probability information is not informative.

Only non-adjacent syllables are informative about what words are in the language.



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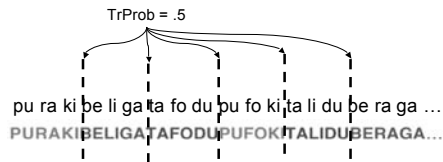
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### Peña et al. 2002: Experimental Study

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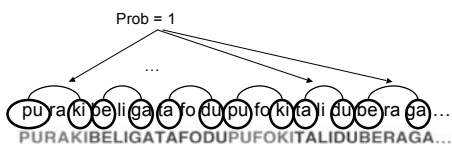
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### Peña et al. 2002: Experimental Study

The artificial language: "AXC language"

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First Question: Good word segmentation?

PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

10 minute familiarization period

Can adults recognize words from part-words?  
Remember: transitional probability won't help - it'll bias them the wrong way.

word: pu ra ki  
 $(\text{TrProb pura}) = 1/3, \text{TrProb (raki)} = 1/3,$   
 $\text{TrProb (puraki)} = \text{TrPob(pura)} * \text{TrProb(raki)} = 1/3 * 1/3 = 1/9$

part-word: ra ki be  
 $\text{TrProb(raki)} = 1/3, \text{TrProb (kibe)} = 1/2$   
 $\text{TrProb (rakibe)} = \text{TrPob(raki)} * \text{TrProb(kibe)} = 1/3 * 1/2 = 1/6$

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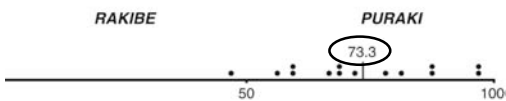
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First Question: Good word segmentation?

PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

10m ...PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...10m



Adults prefer real words to part-words that they actually heard. This means they can unconsciously track the non-adjacent probabilities of the AXC language and identify the words.

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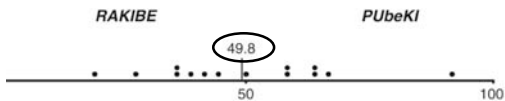
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Next Question:  
Good generalization about words?

PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

10m ...PURAKIBELIGATAFODUPUFOKITALIDUBERAGA ...10m



Adults prefer part-words that they actually heard over real words that follow the generalization about words in the language, but which they didn't actually hear. This means they can't use the non-adjacent probabilities of the AXC language to identify the words *in general*.

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### What's going on?

✓ PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

X PURAKIBELIGATAFODUPLUFOKITALIDUBERAGA...

"We conjecture that this reflects the fact that the discovery of components of a stream and the discovery of structural regularities require different sorts of computations...the process of projecting generalizations...may not be statistical in nature." - Peña et al. (2002)

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### Prediction for Different Types of Computation

✓ PURAKIBELIGATAFODUPUFOKITALIDUBERAGA...

X PURAKIBELIGATAFODUPLUFOKITALIDUBERAGA...

"...it is the type of signal being processed rather than the amount of familiarization that determines the type of computation in which participants will engage...changing a signal even slightly may induce a change in computation." - Peña et al. (2002)

Types of computation: statistical, algebraic

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### New Stimuli: Stimulating Algebraic Computation?

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.PURAKIBELIGATAFODUPUFOKITALIDUBERAGA

10 minute familiarization period with 25ms (subliminal) gaps after each word



If word segmentation is already accomplished, subjects will be free to engage their algebraic computation. This should allow them to succeed at identifying the properties of words in the artificial language (e.g. pu\_ki, be\_ga, ta\_du), since this kind of structural regularity is hypothesized to be found by algebraic computation.

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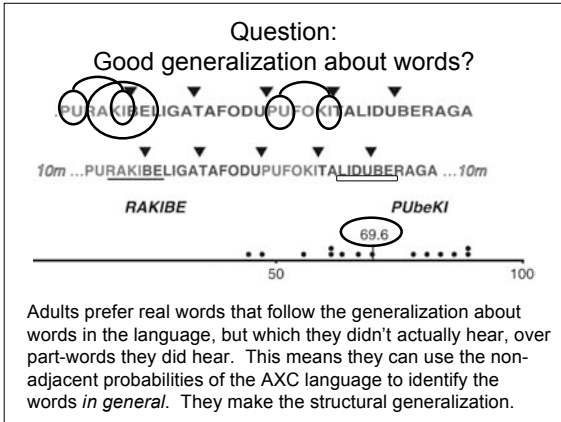
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Prediction: Algebraic vs. Statistical

Idea: Subjects are really using a different kind of computation (algebraic) because of the nature of the input. Specifically, the input is already subliminally segmented for them, so they don't need to engage their statistical computation abilities to accomplish that. Instead, they are free to notice more abstract properties via algebraic computation.

Prediction 1: If the words are *not* segmented subliminally, statistical computation will be invoked. It doesn't matter if subjects hear a lot more data. Their performance on preferring a real word they didn't hear over a part-word they did hear will not improve.

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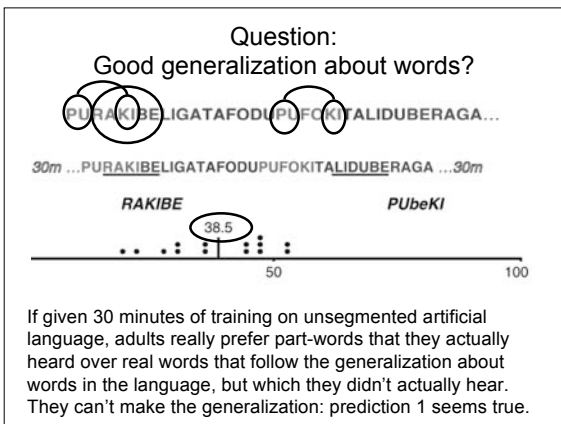
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### Prediction: Algebraic vs. Statistical

Idea: Subjects are really using a different kind of computation (algebraic) because of the nature of the input. Specifically, the input is already subliminally segmented for them, so they don't need to engage their statistical computation abilities to accomplish that. Instead, they are free to notice more abstract properties via algebraic computation.

Prediction 2: If the words *are* segmented subliminally, algebraic computation will be invoked. It doesn't matter if subjects hear a lot less data. They will still prefer a real word they didn't hear over a part-word they did hear.

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### Question:

Good generalization about words?



If given 2 minutes of training on segmented artificial language, adults really prefer real words that follow the generalization about words in the language, but which they didn't actually hear, over part-words that they actually heard. They still make the generalization: prediction 2 seems true.

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### Peña et al. (2002): Summary

While humans may be able to compute powerful statistical relationships among the language data they're exposed to, this may not be enough to capture all the linguistic knowledge humans come to possess.

In particular, learning structural regularities (like structural properties of words) may require a non-statistical learning mechanism, perhaps algebraic computation.

Different kinds of computation can be cued in learners based on the data at hand. Statistical computation was cued by the need to group and cluster items together. Algebraic computation was cued once items were already identified, and generalizations had to be made among the items.

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**What kind of things can statistical computation keep track of?**

Idea: "Learners might be able to compute certain types of statistical regularities, but not others." - Newport & Aslin (2004)

What kind of non-adjacent regularities do real language actually exhibit? Maybe only these non-adjacent regularities are the kinds that humans can compute using statistical computation.

Important: AXC-syllable language (statistical regularity between 1st and 3rd syllable of the word) *does not naturally occur in real languages.*

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**Naturally occurring non-adjacent regularities**

Example of non-adjacent dependency: between individual segments (sounds)

Semitic languages: words built from consonantal "stems", where vowels are inserted to make different words

Arabic: k-t-b = "write"

kataba = "he wrote"      yaktubu = "he writes"

kitaab = "book"      maktab = "office"

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**Non-adjacent segment regularities: consonants**

Newport & Aslin (2004): AXCXEX segment language  
p\_g\_t, d\_k\_b      filler vowels: a, i, æ, o, u, e

Subject exposure time to artificial language made up of these kinds of words: 20 minutes

Result 1: Subjects were able to segment words based on non-adjacent segment regularities.

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### Non-adjacent segment regularities: vowels

Newport & Aslin (2004): XBDXF segment language  
\_a\_u\_e,\_o\_i\_æ filler consonants: p, g, t, d, k, b

Subject exposure time to artificial language made up of  
these kinds of words: 20 minutes

Result 2: Subjects were again able to segment words  
based on non-adjacent segment regularities.

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### Newport & Aslin (2004): Summary

When subjects are tested with artificial languages that reflect  
properties real languages have (such as statistical  
dependencies between non-adjacent segments), they are  
still able to track statistical regularities.

This suggests that statistical computation is likely to be  
something real people use to notice the statistical  
regularities (non-adjacent or otherwise) that real languages  
have. It is not just something that will only work for the  
regularities that have been created in a lab setting, such as  
those between non-adjacent syllables in artificial languages.

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Questions?

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