

# The role of variability in linguistic generalization: evidence from a computerized language training game with 7-year-olds

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**Hypothesis:** Generalization is promoted by exposure to more varied exemplars, since this allows structures to be **disassociated** from trained instances.

**We find evidence for this in a language training study with 7 year olds.**

## Training Input

Japanese spatial postpositions

“above” sentence	<p><i>banana o chokorēto no ue ni oku</i></p> <p>object case-marker ABOVE oku = put</p> <p>“Put the banana above the chocolate”</p>
“below” sentence	<p><i>banana o chokorēto no shita ni oku</i></p> <p>object case-marker BELOW oku = put</p> <p>“Put the banana below the chocolate”</p>

### High variability (HV) exemplars:

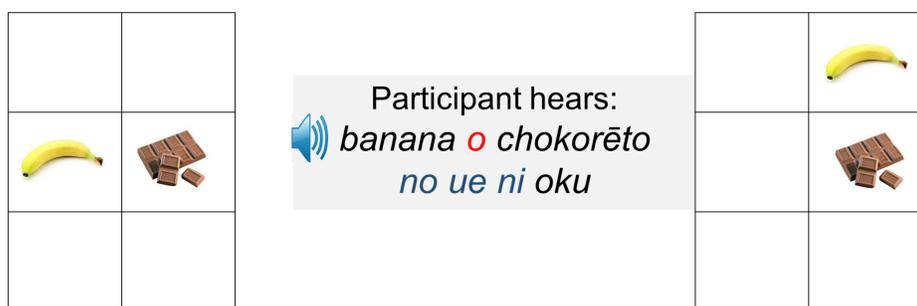
28 unique “above” sentences, 28 unique “below” sentences

### Low variability (LV) exemplars:

2 (repeated\*14) “above” sentences, 2 “below” sentences  
each sentence had two unique nouns (8)

- HV & LV matched for: total exposure (56) & numb nouns (8)
- All nouns are **ENGLISH COGNATES**

## Computerized training game



- All stimuli produce by native speaker
- Participants receive **FEEDBACK** as to whether response is correct.

## Participants

- HV: 44; LV 42 7-8 year olds- tested individually in schools
- Native English speakers, no prior knowledge of Japanese or other postpositional language

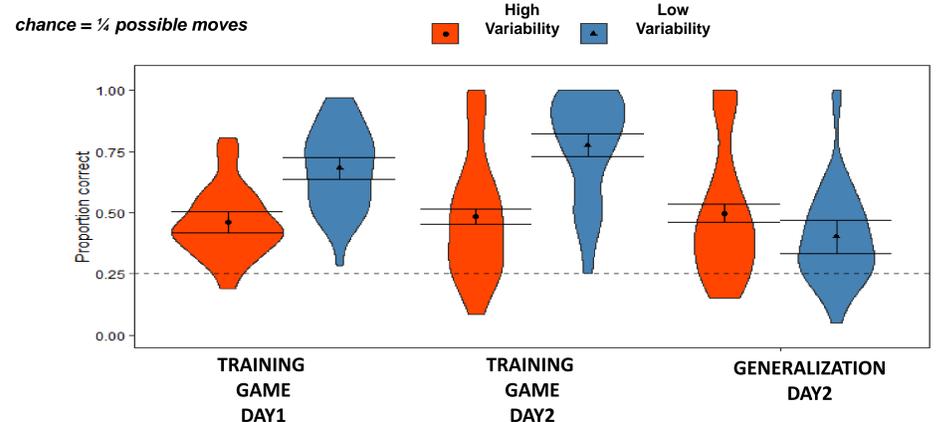
## Procedure

- Exposed to language by playing the game over two sessions (no instruction)
- Data collected during training
- **Generalization test at the end of day 2:** play the game with **NOVEL NOUNS (more cognates)** and **NO FEEDBACK**

## Modelling

- NDL model (Baayen et al., 2011; Ramscar et al. 2010) with a discriminative implementation of the delta rule (Widrow & Hoff, 1960)
- CUES (10) : 8 nouns + ABOVE/BELOW,
- OUTCOMES (2): noueni + shitani
- Trained using the same two input sets as human children

## Findings



### DURING EXPOSURE:

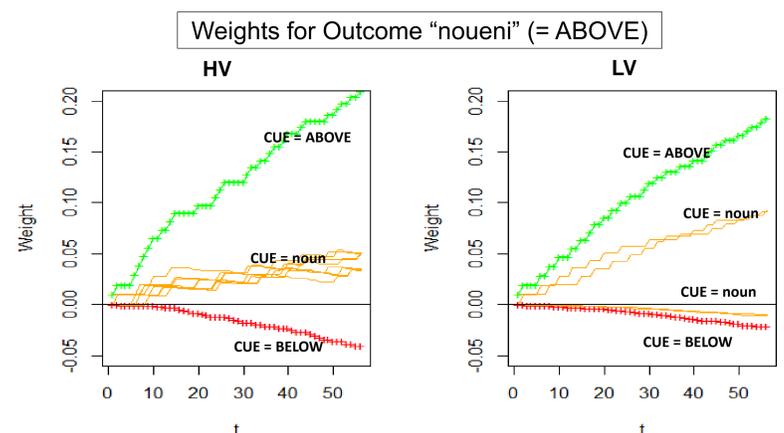
LV > HV ( $BF > 10$ )  
(repetition makes it easier!)

### AT TEST:

HV > LV ( $BF = 4.5$ )  
variability promoted generalization

- Breaking down error types: LV participants show poor learning of semantics post-position semantics- i.e. that noueni = ABOVE, noshitani = BELOW
- HV participants show strong correlation between performance in training performance at test ( $r=.8$ ); LV participant do not ( $r=.007$ )

## Computational Model



Slower learning of correct semantics for post-position in LV condition due to lesser dissociation with highly associated nouns.

## Further Ongoing and Planned Research

**ONGOING (so far, N=19): Skewed condition:** like HV input, but with 2 high F, repeated exemplars per postposition.

- Will repeated exposure to a subset of instances in skew aid generalization (Hsu & Bishop 2014)?

**PLANNED:** Experiment comparing HV/LV input given exposure with mixed NP order (i.e. as in natural Japanese)?

- Will 7year olds manage this more difficulty task and still show HV advantage?

**PLANNED:** Experiment with the two possible word orders with variability manipulated across the whole utterance.

- Will participants show weaker learning of meaning of the post-positions given an input set where the meaning of the utterance can always be discriminated *before* the post-position is encountered (=strong test of discrimination learning account)

### References

Baayen, R. H., et al. (2011). An amorphous model for morphological processing in visual comprehension based on naive discriminative learning. *Psychological review*, 118(3), 438.; Training understanding of reversible sentences: a study comparing language-impaired children with age-matched and grammar-matched controls. PeerJ, 2, e656; Ramscar, M., et al. (2010). The effects of feature-label-order and their implications for symbolic learning. *Cognitive science*, 34(6), 909-957; Wonnacott, E., et al. (2012). Input effects on the acquisition of a novel phrasal construction in 5 year olds. *Journal of Memory and Language*, 66(3), 458-478.;