Title: Theory formation, causal models, and the evolution of learning

Date: Sep 27, 2017 02:00 PM

URL: http://pirsa.org/17090051

Abstract: I will present several studies showing a surprising pattern. Not only can preschoolers learn abstract higher-order principles from data, but younger learners are actually better at inferring unusual or unlikely principles than older learners and adults. This pattern also holds for children in Peru and in Headstart programs in Oakland, California. I relate this pattern to computational ideas about search and sampling, to evolutionary ideas about human life history, and to neuroscience findings about the negative effects of frontal control on wide exploration. My hypothesis is that our distinctively long, protected human childhood allows an early period of broad hypothesis search, exploration and creativity, before the demands of goal-directed action set in.

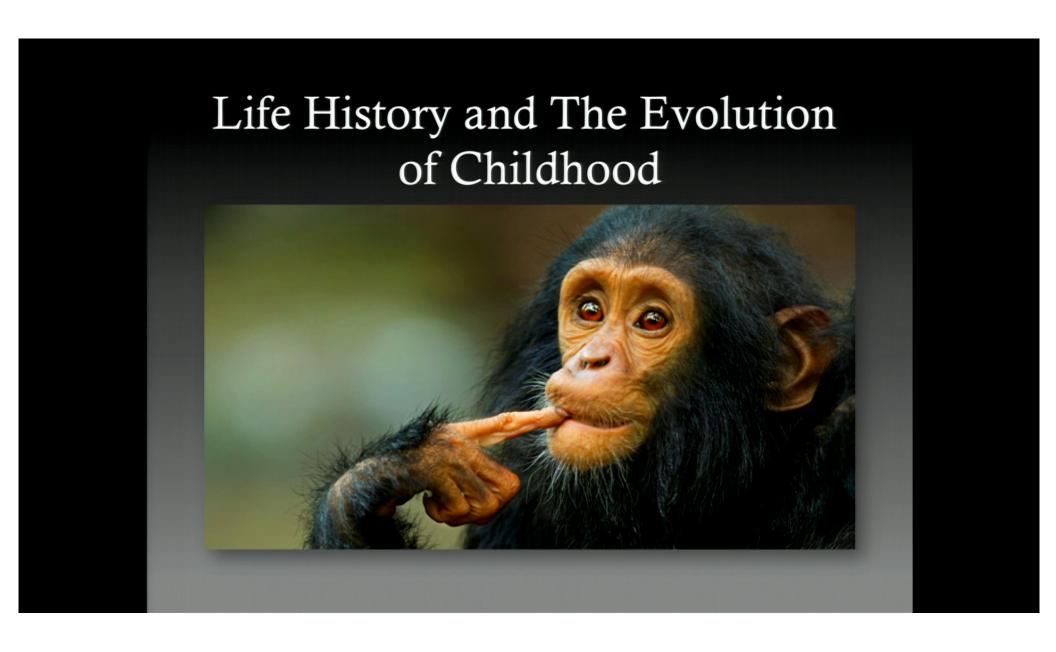
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Life History and Learning:

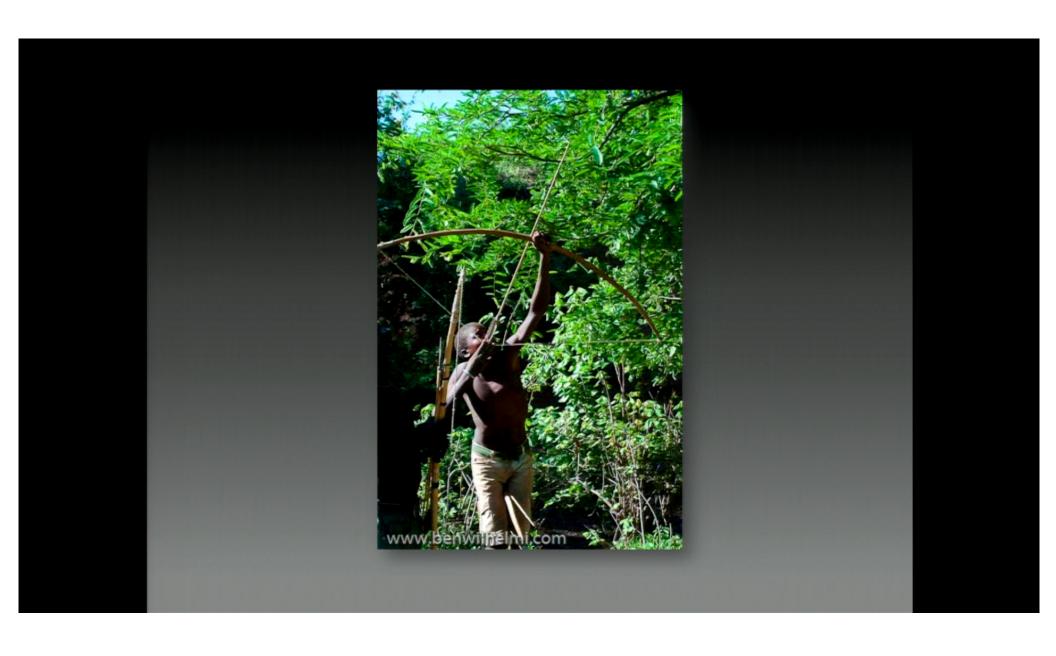
AKA A Grand Unified Theory of Childhood

Alison Gopnik

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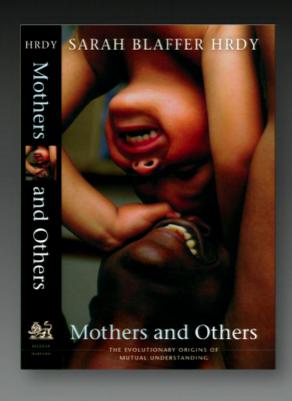


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The Investment Triple Threat: Pair Bonding and Paternal Investment

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The Triple Threat: Alloparents

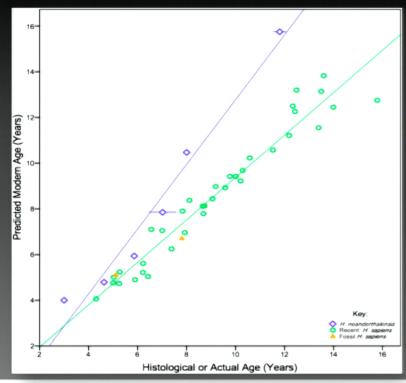


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Fossil Evidence: Life History in Hominin Evolution



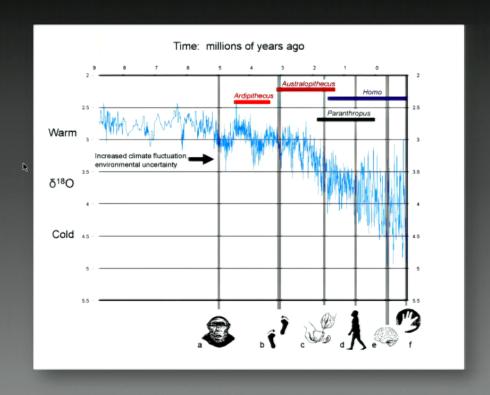
Smith T M et al. PNAS 2010;107:20923-20928

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PNAS

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Ecological Evidence: Climate Change Induced Humans



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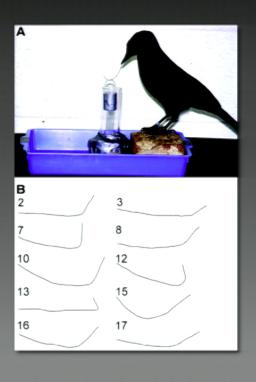
Comparative Evidence: Life History, Brain Size and Learning: Marsupials: Quokka vs Possums





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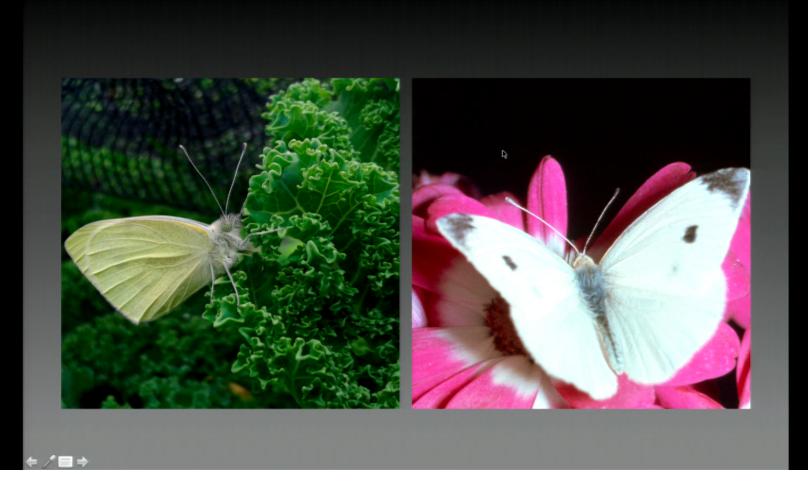
Crows vs Chickens





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Insects: Cabbage Whites & Kale



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THE THEORY THEORY 2.0 Learning Generative Probabilistic Bayesian Models from Statistical Data

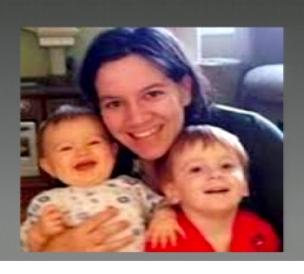
- Gopnik & Wellman, Psychological Bulletin, 2012
- Gopnik, Science, 2012



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The Sampling Hypothesis

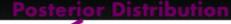
E. Bonawitz, S. Denison, T. Griffiths, A. Gopnik. (2014). Probabilistic Models, Learning Algorithms, Response Variability: Sampling in Cognitive Development. *Trends in Cognitive Sciences* doi.org/10.1016/j.tics. 2014.06.006



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Approximating Bayesian inference

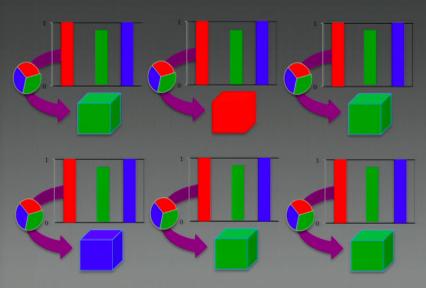
The Sampling Hypothesis



$$P(h|d) = \frac{P(d|h)P(h)}{\sum_{h' \in \mathcal{H}} P(d|h')P(h')}$$

Problem:

Large Hypothesis Space



Solution:

Monte Carlo Methods

- Variable-hypotheses sampled "at random"
- Systematic—more probable hypotheses sampled more often.

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Exploitation vs. Exploration

Low-temperature search

Quick to settle on high-probability answer

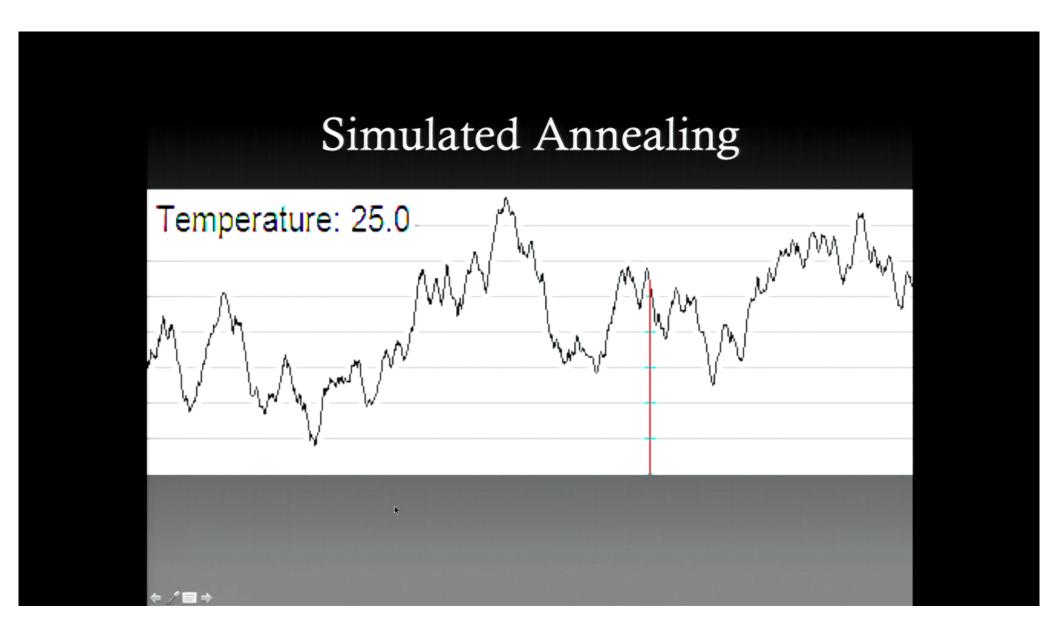
May miss low-probability answer

High-temperature search

Slow to settle on high-probability answer

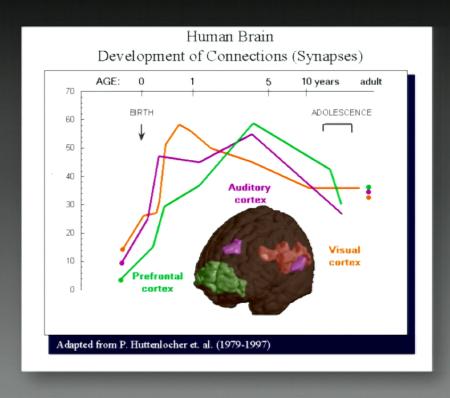
More likely to find low-probability answer

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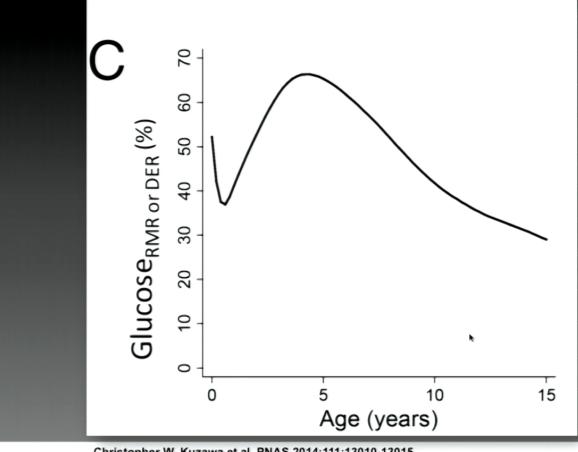


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Christopher W. Kuzawa et al. PNAS 2014;111:13010-13015

PNAS

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Less Frontal Control Leads to More Exploration

- Thompson-Schill et al. <u>Current Directions in Psychological Science</u>. 2009
- Jazz Improvisers Show Less Frontal Activity. Limb et al.
- Frontal TDCS Leads to More Divergent Thinking. Chryskiou et al. Cognitive Neuroscience 2013
- Transient Frontal Release Is Associated with Learning. Bassett et al. <u>PNAS</u> 2011

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When Younger Learners are More Open-Minded

- A. Gopnik, T. Griffiths, & C. Lucas (2015). Current Directions in Psychological Science, 24 (2), 87-92
- C. Lucas, S. Bridgers, T. Griffiths, & A. Gopnik (2014). Cognition. 131, 2, 284–299.
- A. Gopnik, S. O'Grady, C. Lucas, T. Griffiths A. Wente, S. Bridgers, R. Aboody, H. Fung, R. E. Dahl, (2017). *PNAS*.





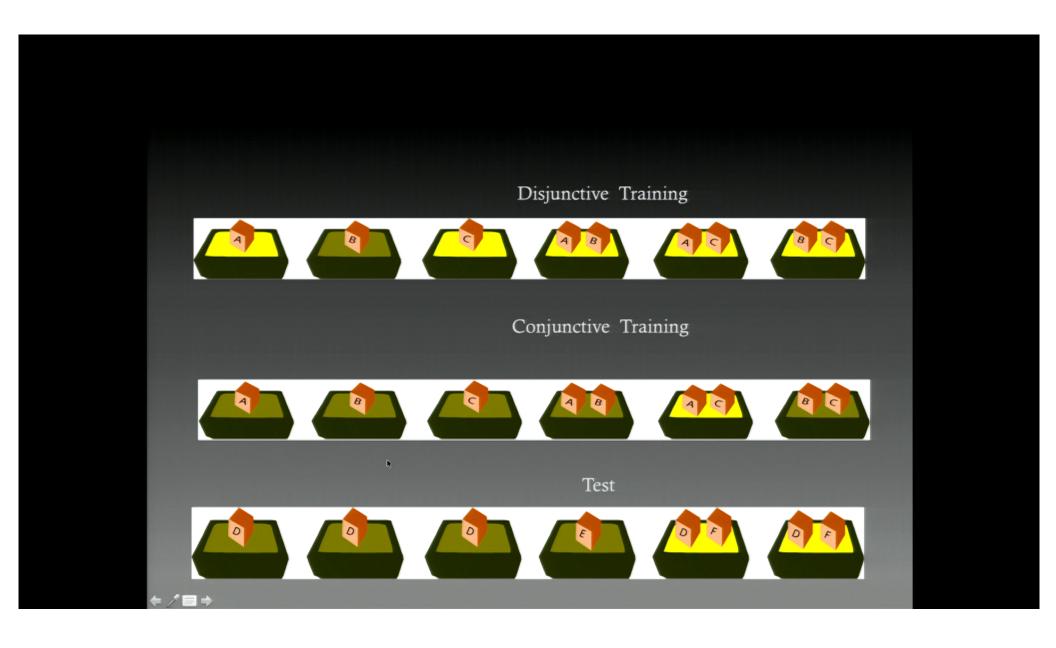
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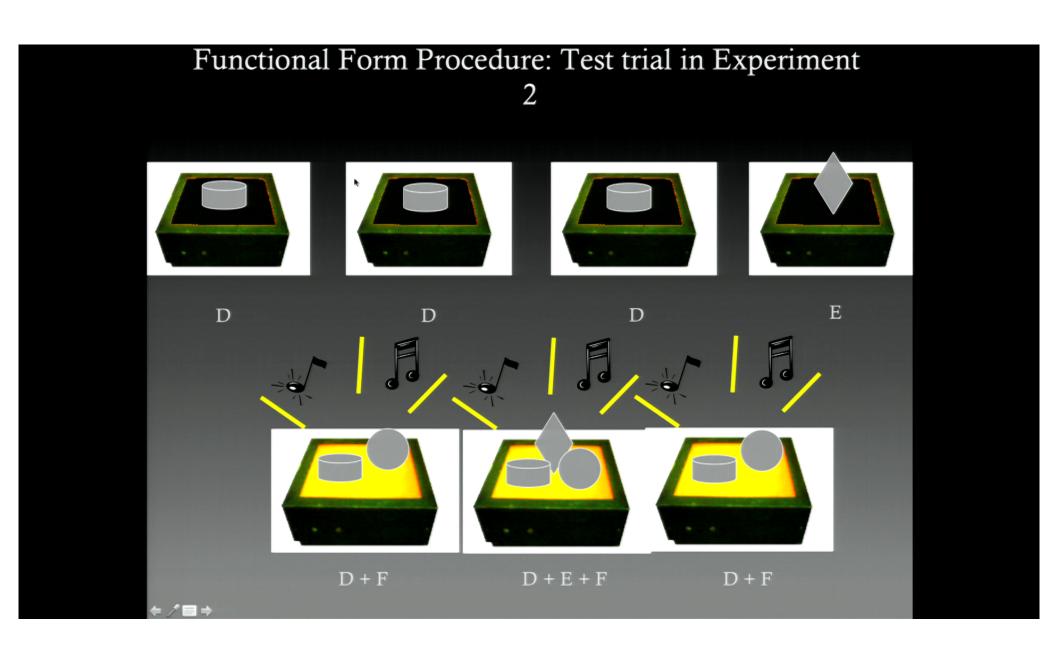


Is D a blicket? Is E a blicket? Is F a blicket?

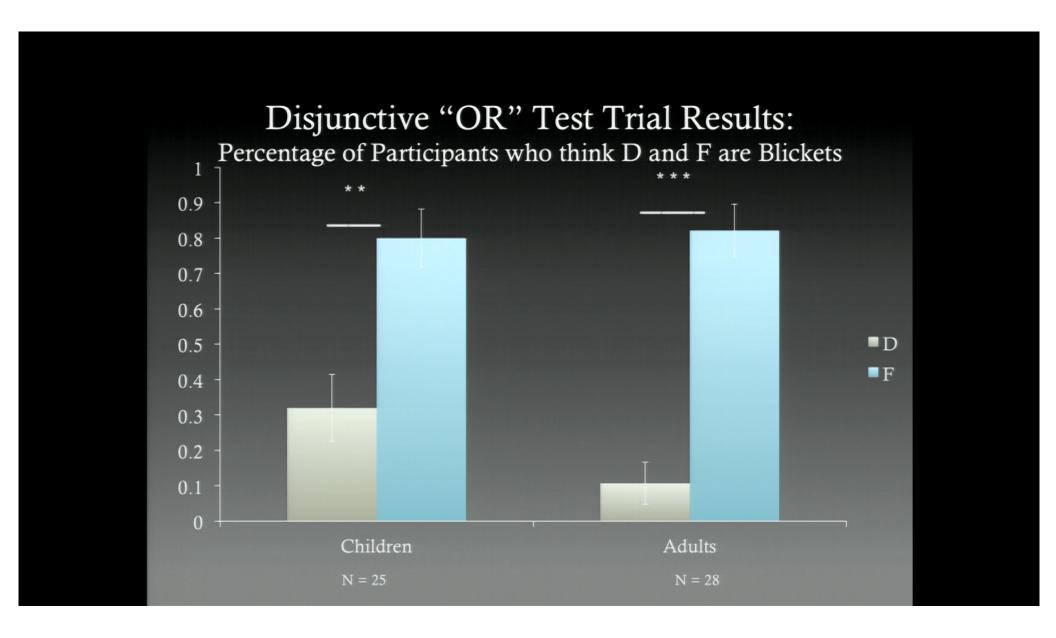
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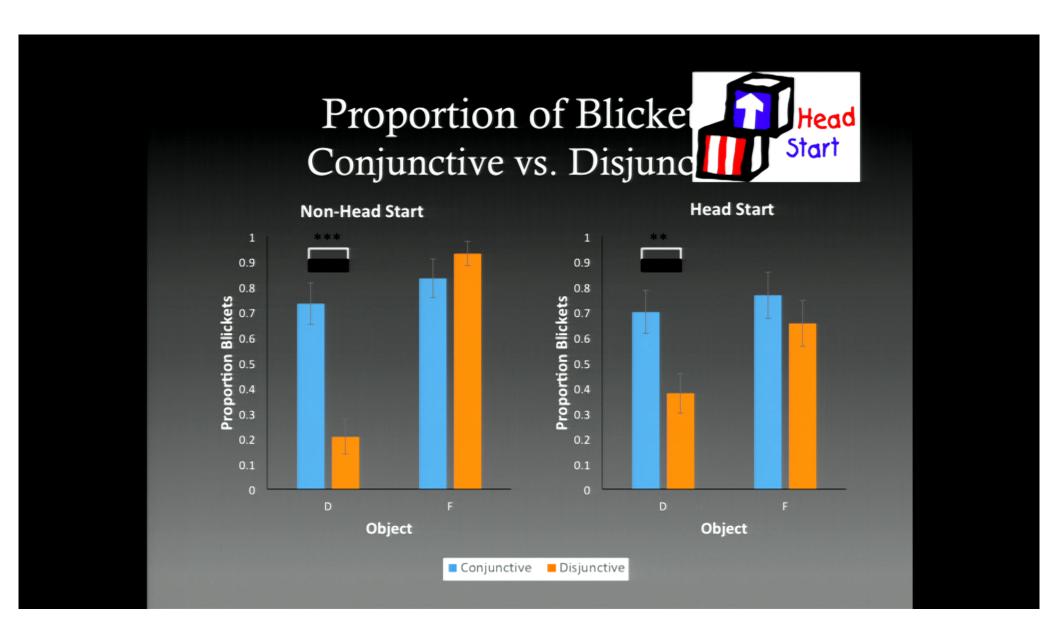
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Is Causal Learning WEIKD Chools Innova Schools in Peru

- Serve Peru's emerging middle-class, many of whom are first- or second-generation immigrants from the Andes or the Amazon.
 N - 60
- The average gross income for families is roughly \$1,200, of which 20-25% of their budget is spent on education
- Compared to Peru undergraduates, N= 83.

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Change Across Development: Gopnik et al. PNAS, 2017.

- Gradual change with accumulated experience?
- Discontinuities in life history transitions? Preschool to school age, school age to adolescence, adolescence to adulthood.

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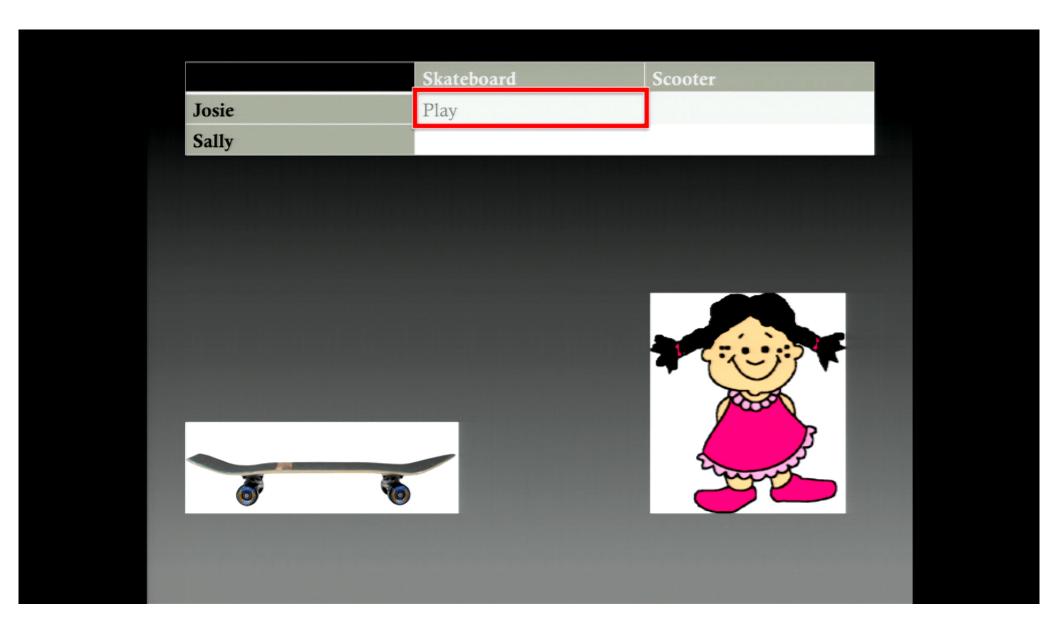
Causal Inference and Social Theories: Seiver, Gopnik & Goodman, Child Development 2013

• Trait vs. situation attribution

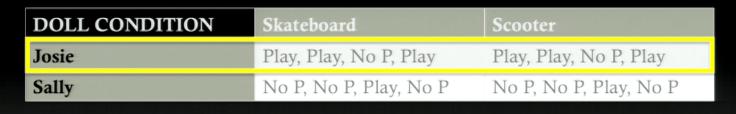
• Trait concepts only appear explicitly and simultaneously around age 6

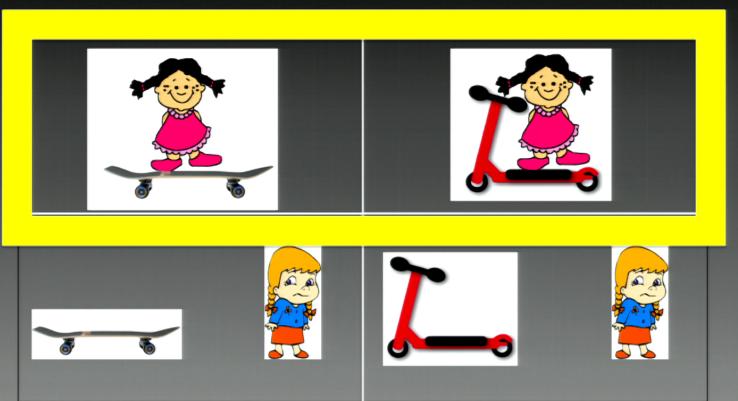
Kelley and co-variation

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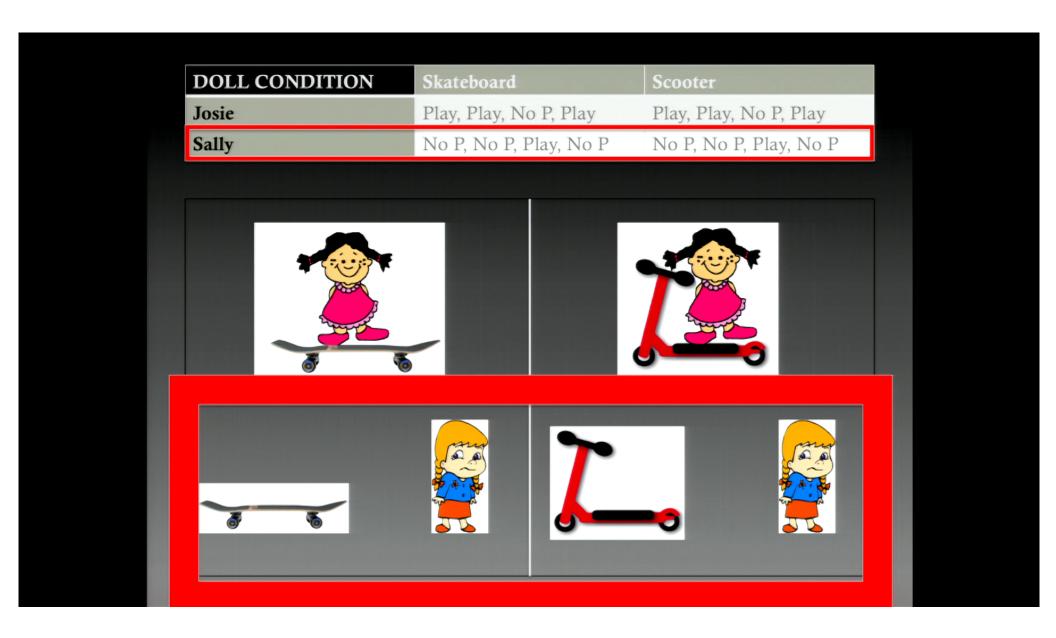


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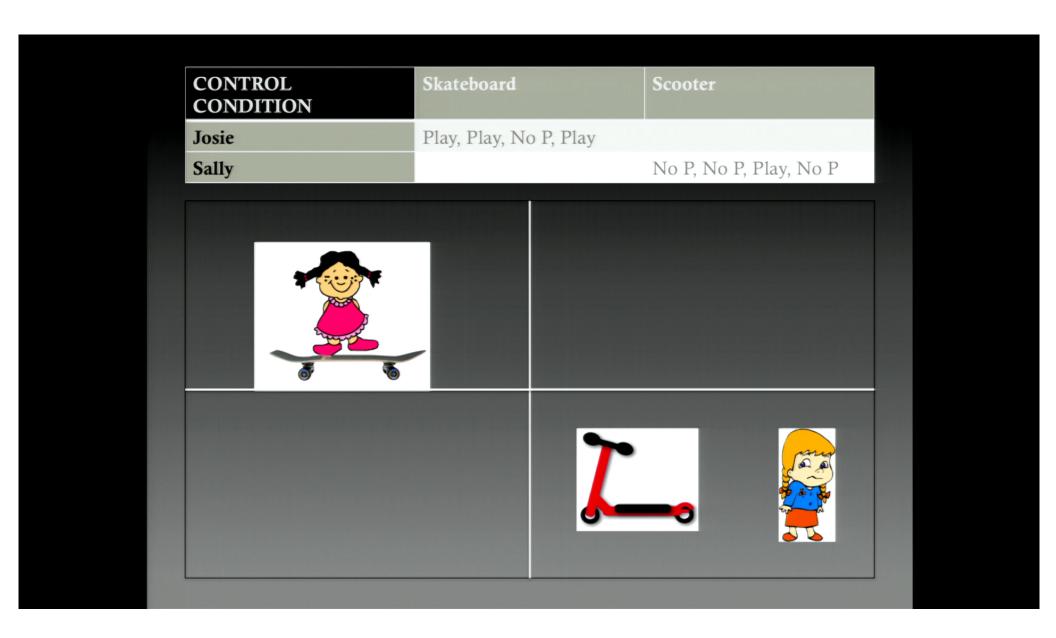




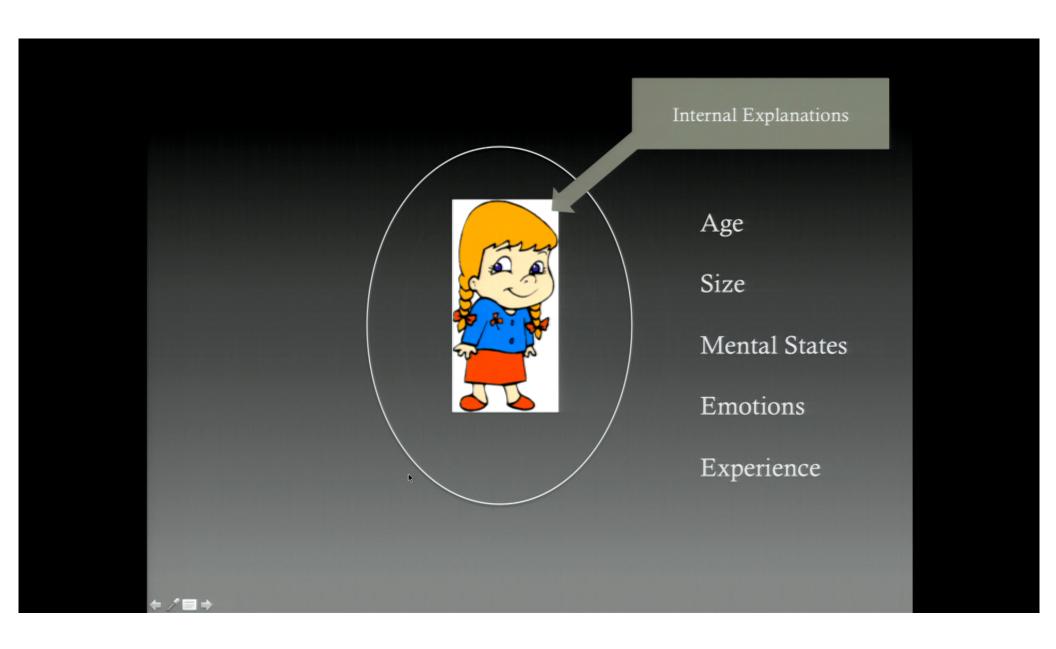
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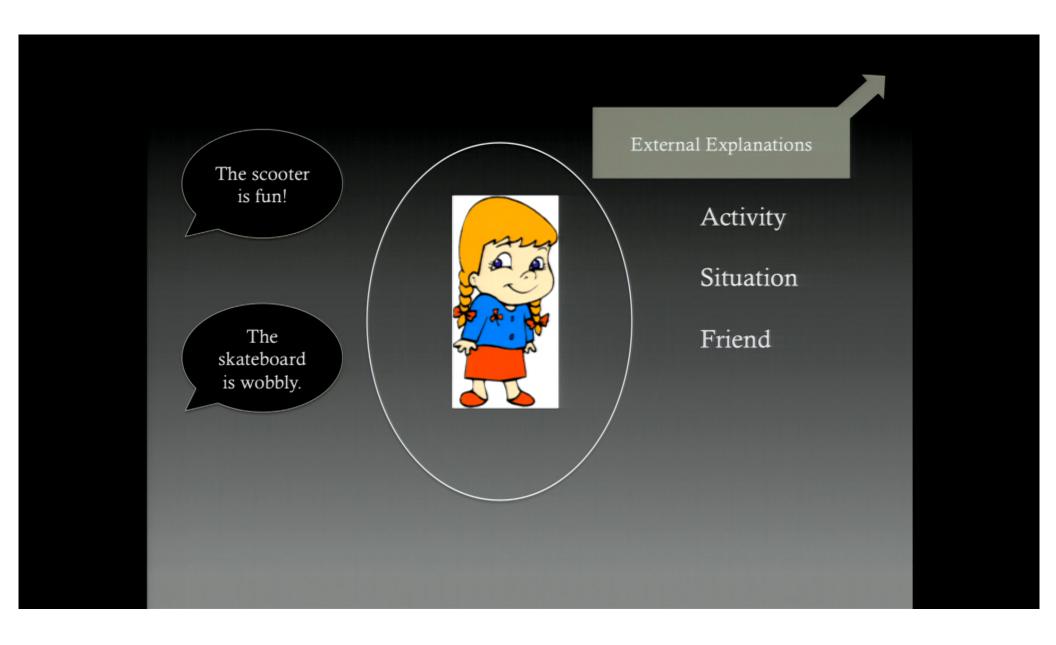
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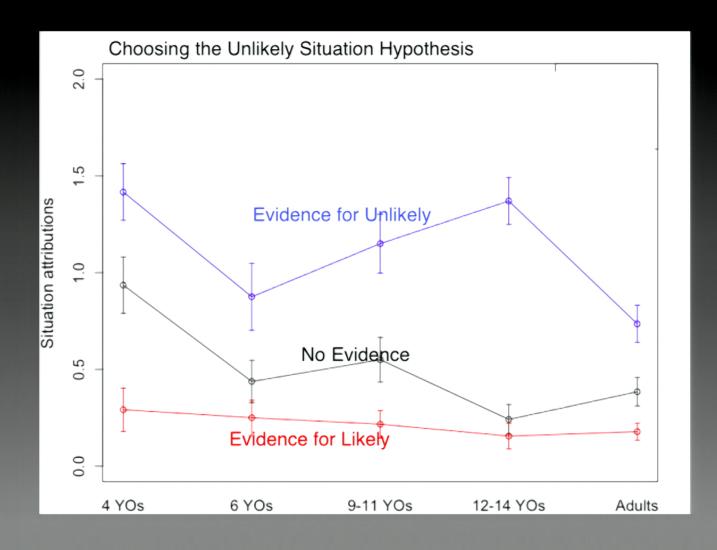
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Other Examples Where Younger Learners Are More Exploratory

Learning situation vs. trait attributions: Seiver et al. Child Development 2013

Learning relational vs. individual concepts: Walker et al. Cognition 2016

Searching a Semantic Network. Bonawitz et al. SRCD, 2015.

Learning foreign language vs. own language distinctions (Kuhl 2004, Werker, 2015).

Learning novel vs. familiar artifact uses. (German & Defeyter, 2000).

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