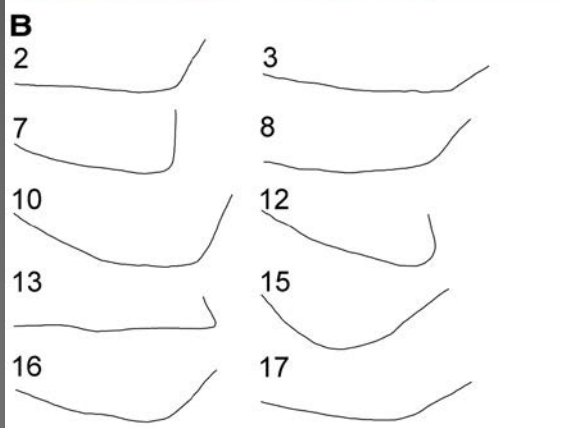


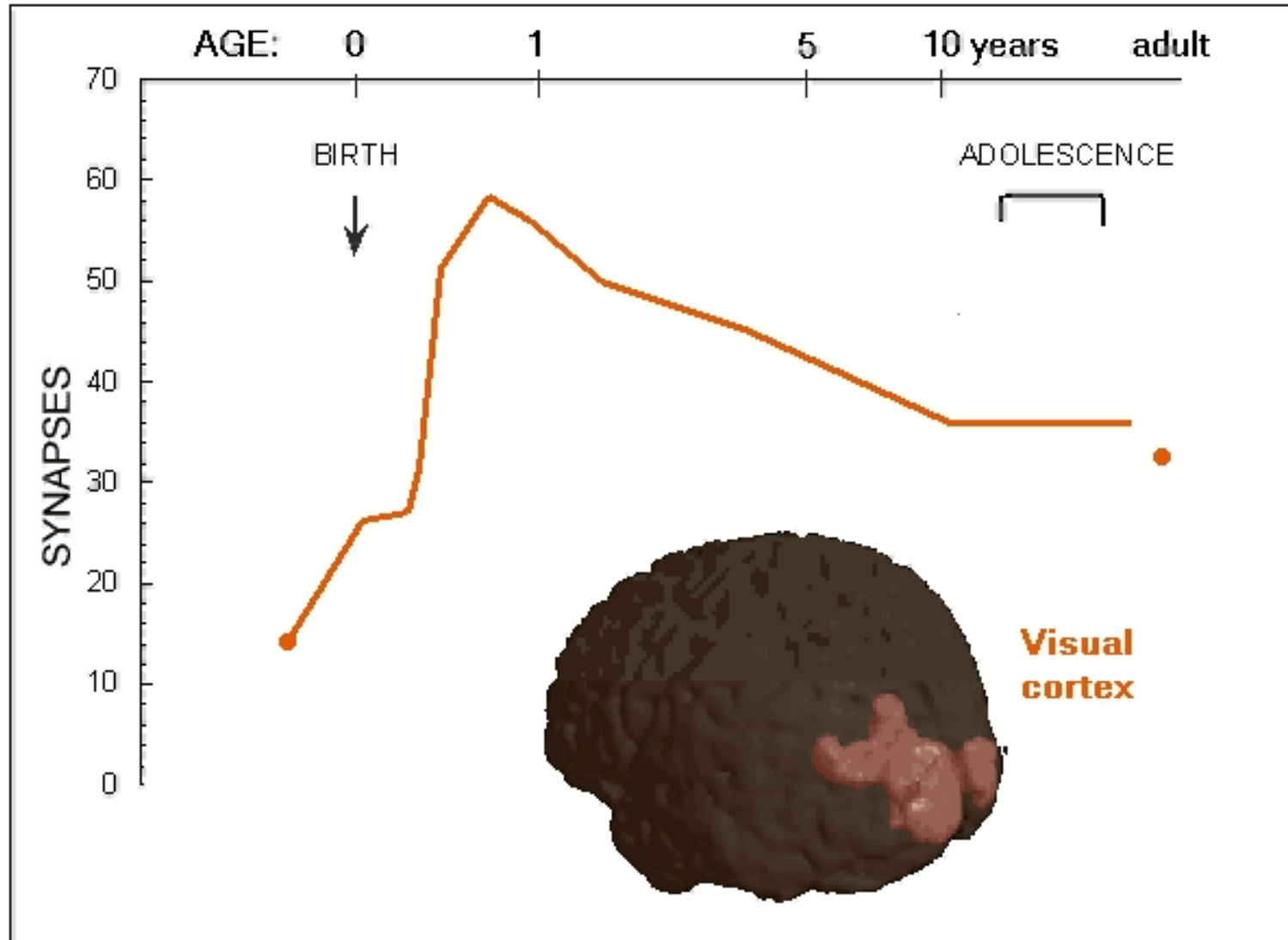
Childhood Is Evolution's Way of
Performing Simulated Annealing:
A life history perspective on
explore-exploit tensions.

Alison Gopnik
Dept. of Psychology
UC Berkeley

Why Childhood?: Longer Childhood, Bigger Brain, Smarter Animal



Human Brain Development of Connections (Synapses)



Adapted from P. Huttenlocher et. al. (1979-1997)

THE THEORY THEORY 2.0

Learning Probabilistic Causal Models from Statistical Data

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

Unanswered Questions

- How do children learn higher-order causal “framework theory” principles as well as specific causal relationships?
- Are there developmental differences?
- How do children search through all the possible hypotheses?

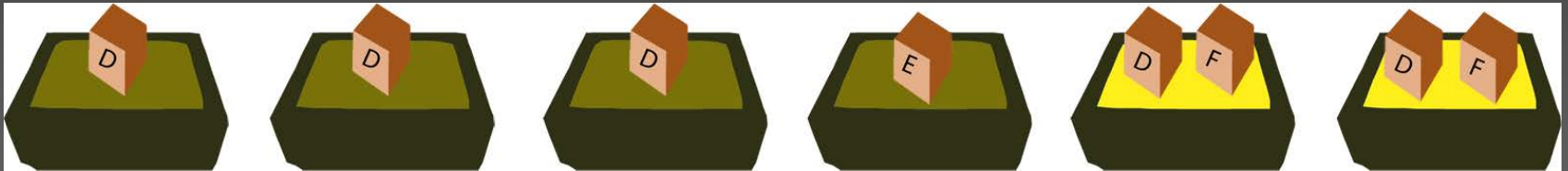
Inferring Abstract Laws

Lucas, Gopnik & Griffiths, 2014,
Cognition

- Framework theories
- Hierarchical Bayes-nets (Griffiths & Tenenbaum, 2007)
- The blessing of abstraction (Goodman, 2010)

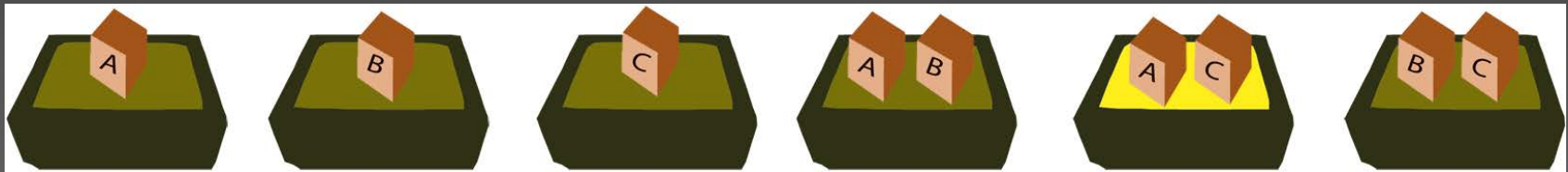


Which objects are blickets?

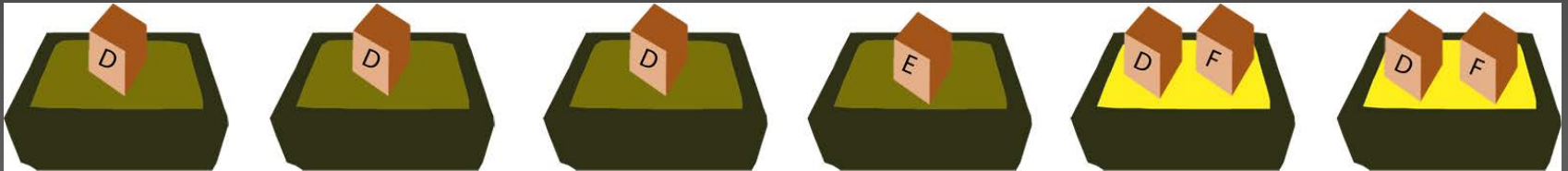


Is D a blicket? Is E a blicket? Is F a blicket?

What if you also saw these events?

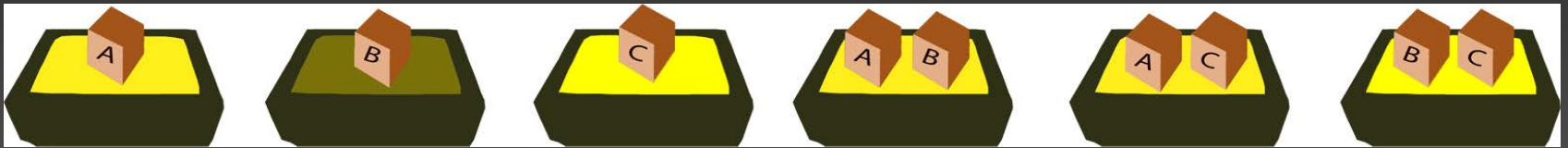


Which objects are blickets?

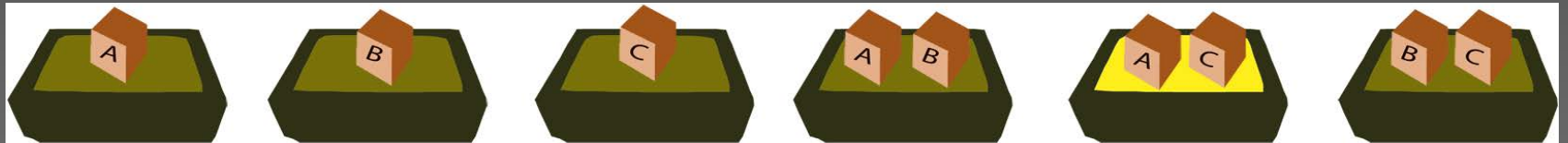


Is D a blicket? Is E a blicket? Is F a blicket?

“Or” Training

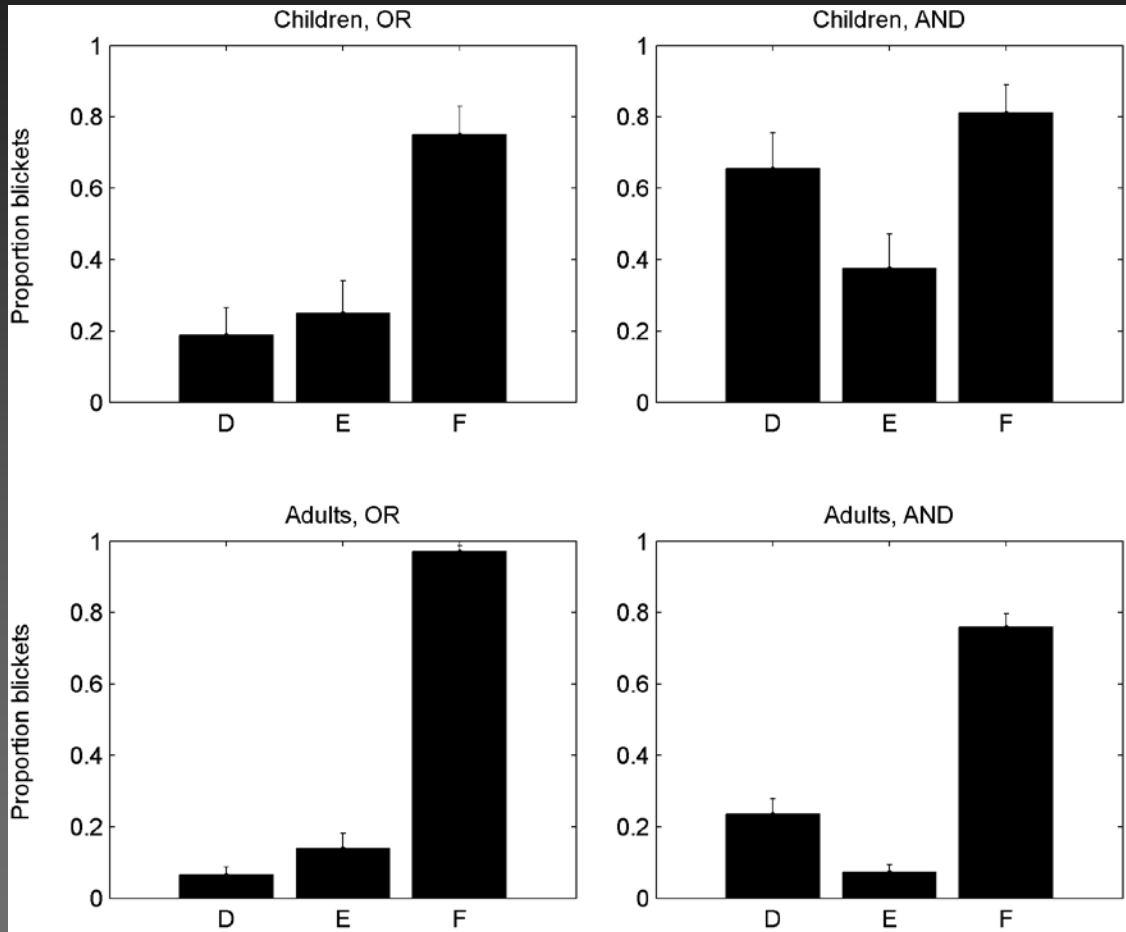


“And” Training

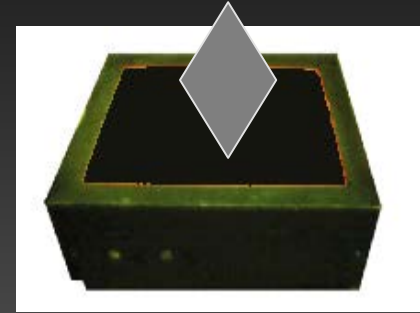
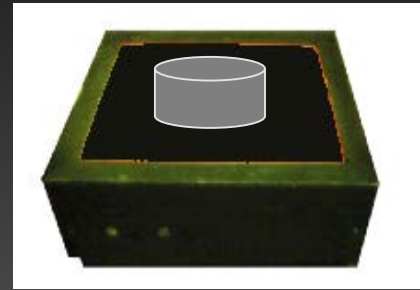
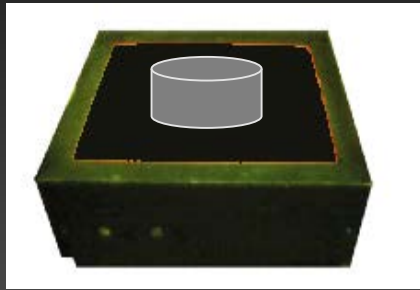
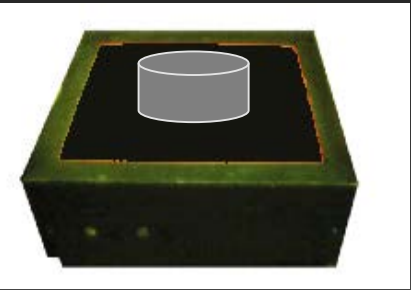


Test





Functional Form Procedure: "OR" and "AND" Test Trial

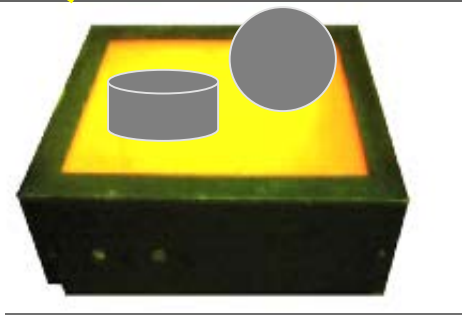
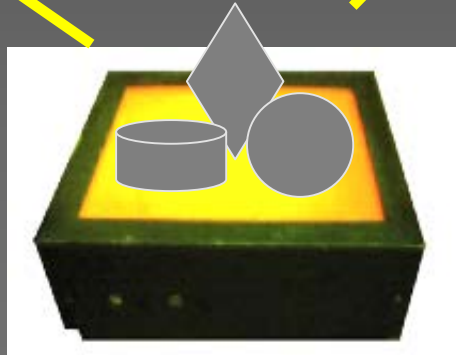
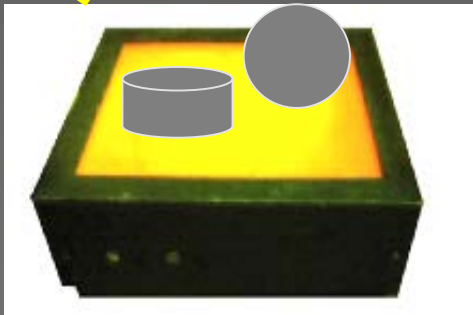
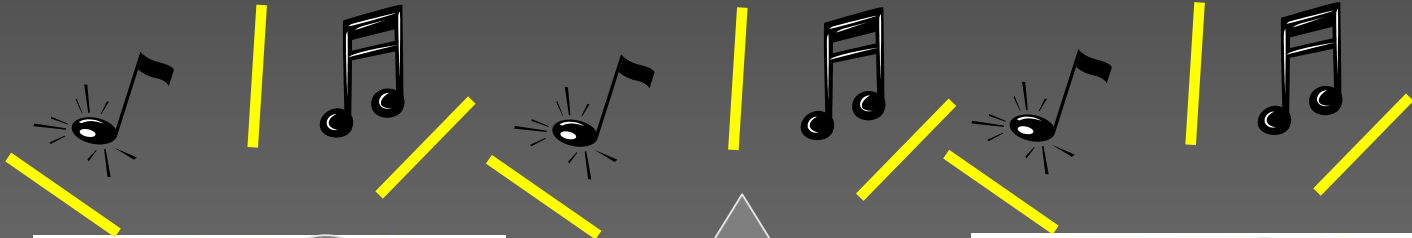


D

D

D

E



D + F

D + E + F

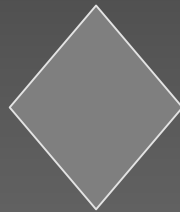
D + F

Functional Form Procedure: “OR” and “AND” Conditions

Which of these
should we use to
make the machine
turn on?



CIRCLE



DIAMOND

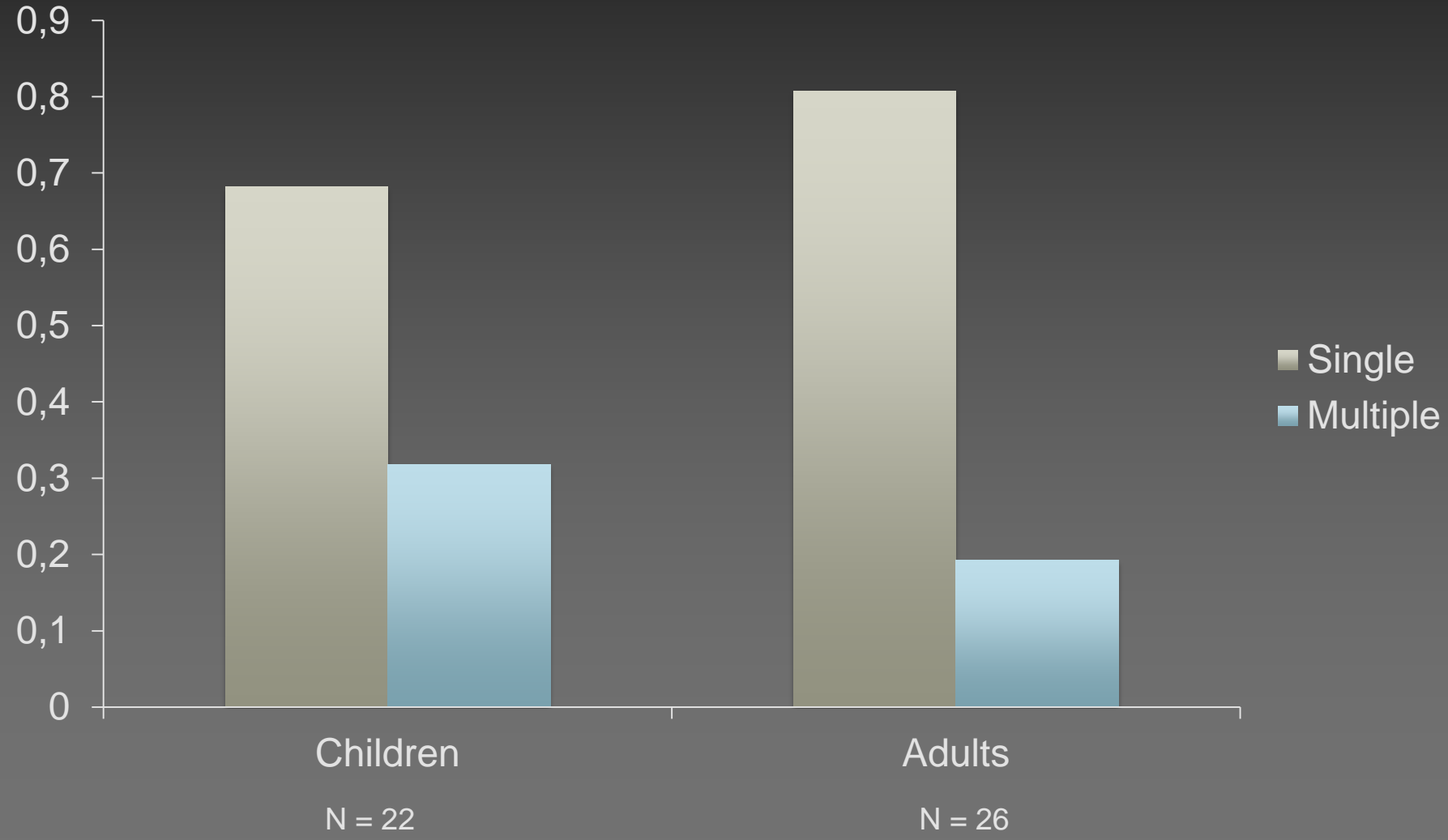


BALL

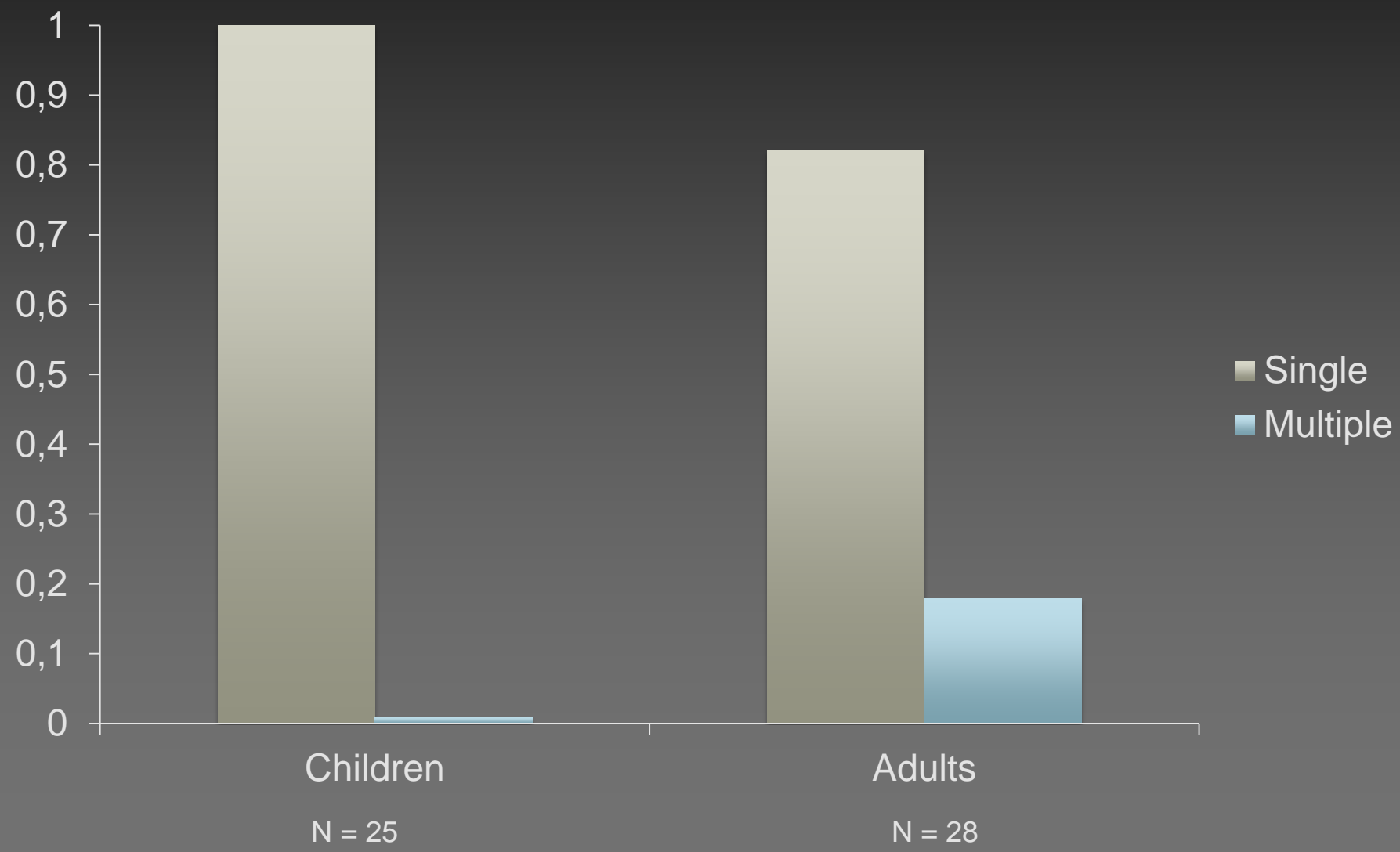
Intervention Question



“BASELINE” Intervention Results: Percentage of Single vs. Multiple Object Interventions

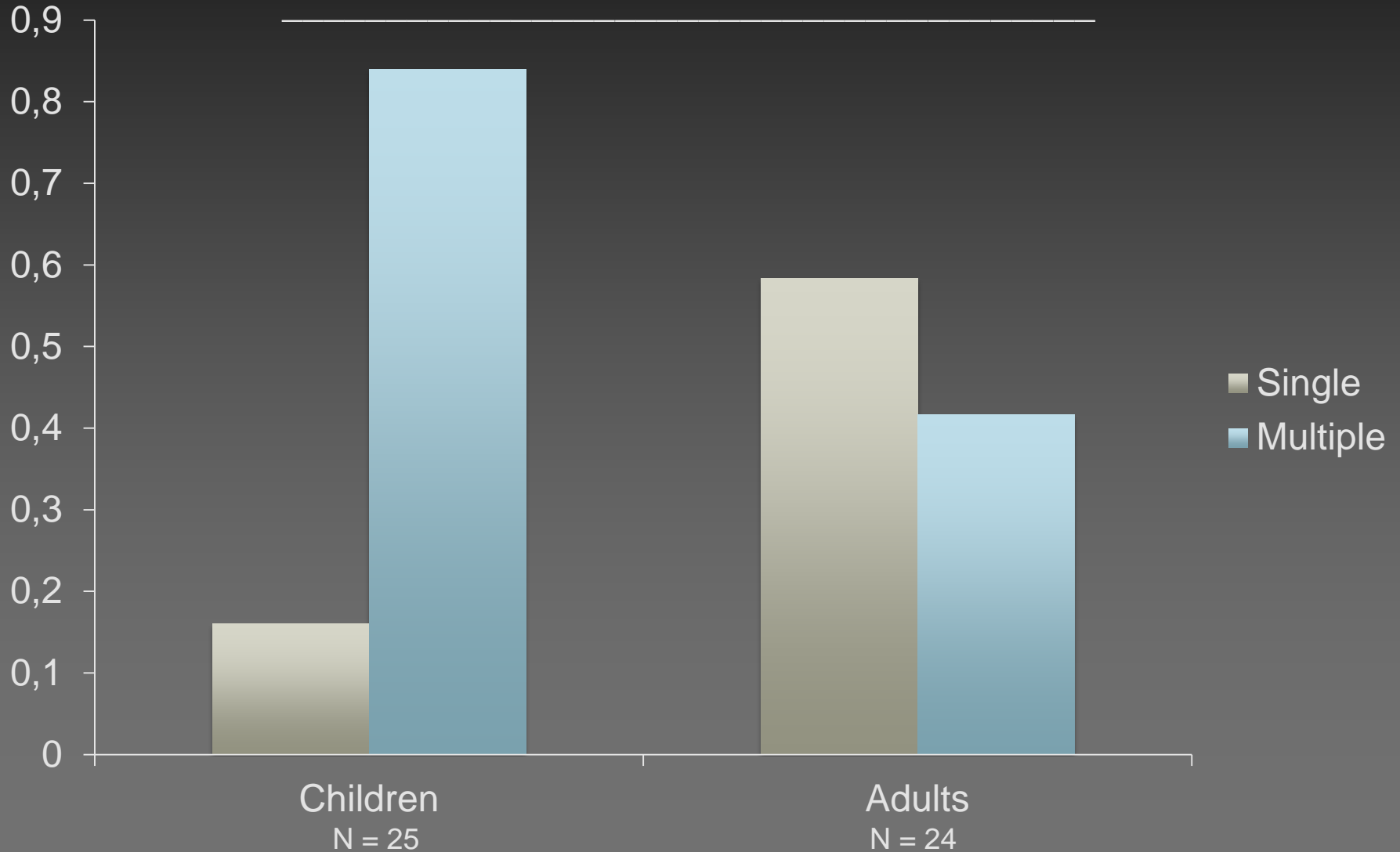


“OR” Intervention Results: Percentage of Single vs. Multiple Object Interventions

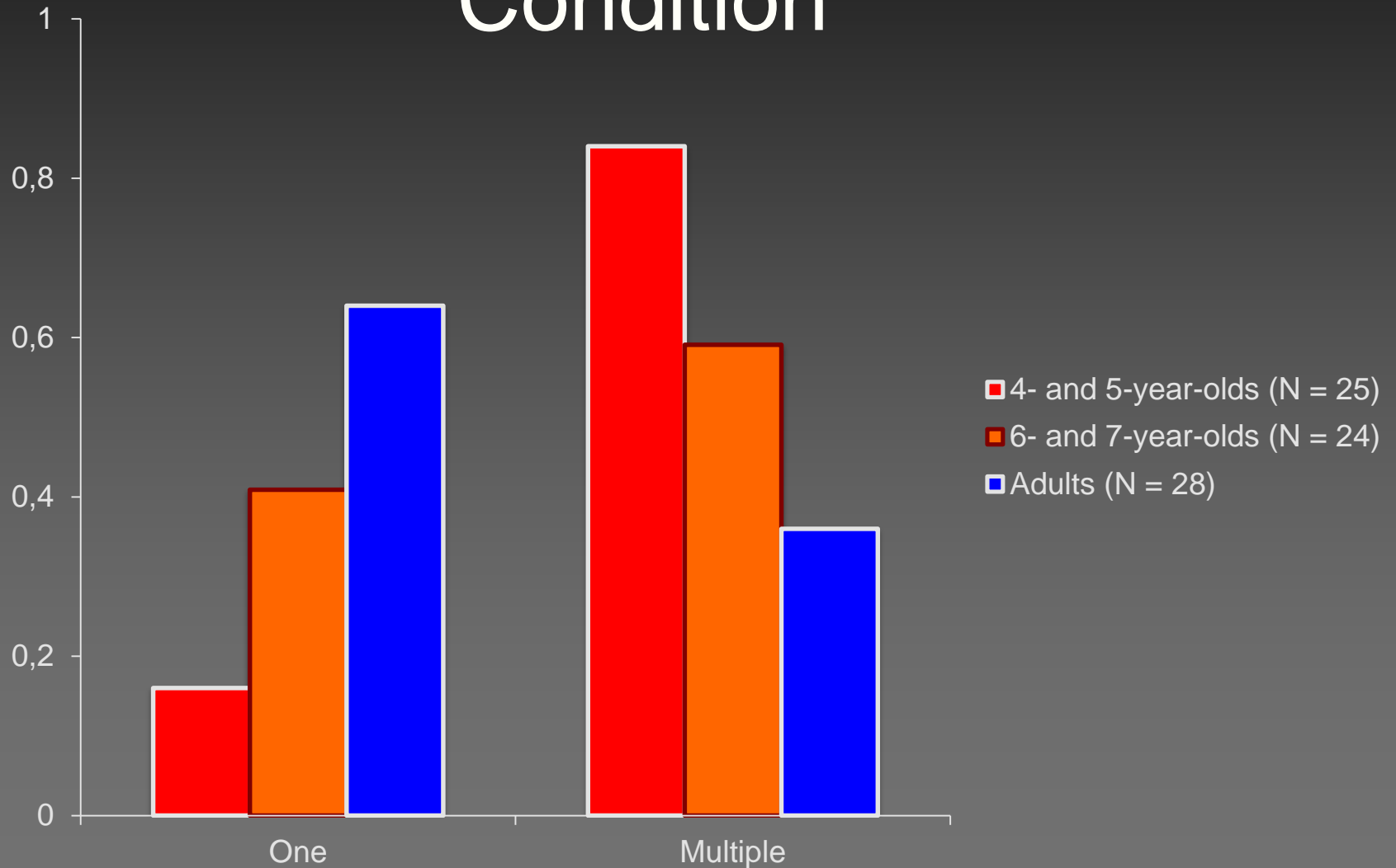


“AND” Intervention Results: Percentage of Single vs. Multiple Object Interventions

**



Intervention Choices for 6- and 7-year-olds: “AND” Condition



When Younger Learners Do Better Than Older Ones

- Learning traits versus situations as causes for action (Seiver et al. *Child Development*, 2013.)
- Learning abstract relational causes (same and different). Walker and Gopnik, *Psychological Science, Cog Sci*, 2015
- Learning multiple uses for a tool, Defeyter and German, 2003
- Learning non-native speech contrasts, Kuhl. Werker

Disadvantages of Frontal Control

- Thompson-Schill et al. , 2009

Why the developmental
differences?

Two Possibilities

Gopnik, Lucas, & Griffiths, *Current Directions in Psychological Science* (In press).

Different Accumulated Knowledge

- Learned prior for “OR” or “Traits” leads to bias

Different types of search and sampling

- Sampling as a solution to the search problem in computer science: Markov Chain Monte Carlo, Particle Filters
- Sampling in adults: Vul & Pashler, 2008

Sampling in Cognitive Development

Bonawitz, Denison, Griffiths & Gopnik, (2014). *Trends in Cognitive Science*,

Denison et al. *Cognition* (2013).

Win-Stay-Lose-Sample. Bonawitz et al. *Cognitive Psychology* (2014)

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

Experimentation, Exploration and Explanation



Simulated Annealing

- Early High-Temperature Search followed by later Low-Temperature Search

Conclusion

Childhood is evolution's way of performing simulated annealing.

Collaborators and Support

- Tom Griffiths
 - Caren Walker
 - Chris Lucas
 - Sophie Bridgers
 - Elizabeth Seiver
 - Noah Goodman
-
- NSF
 - The James S. McDonnell Foundation Causal Learning Collaborative