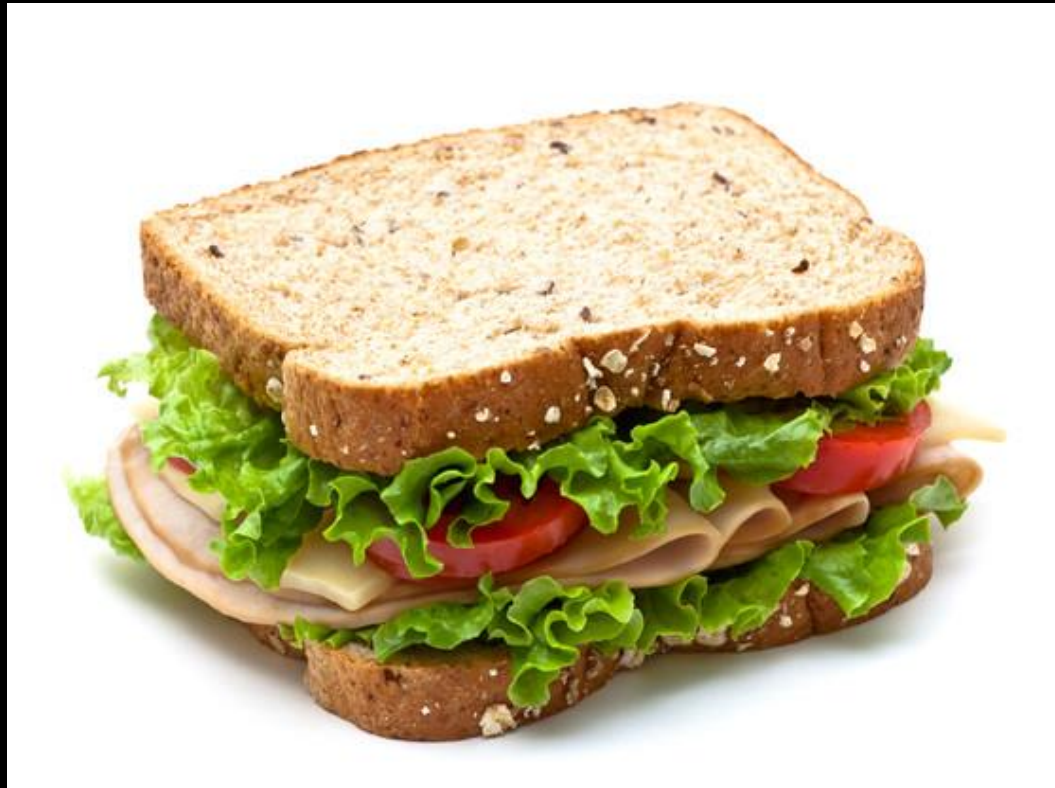


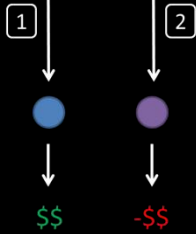
Model-free goal selection

Adam Morris & Fiery Cushman



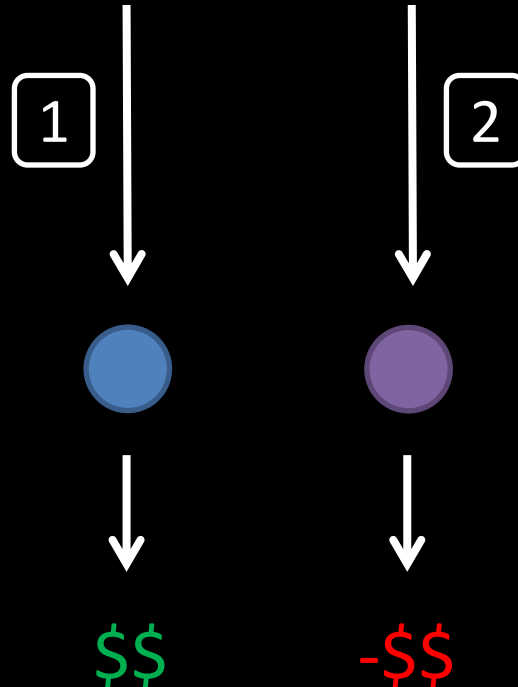
Abscond with an aardvark, abscond with an alligator...

Reinforcement learning



Model-based
reinforcement learning

Goal-directed planning

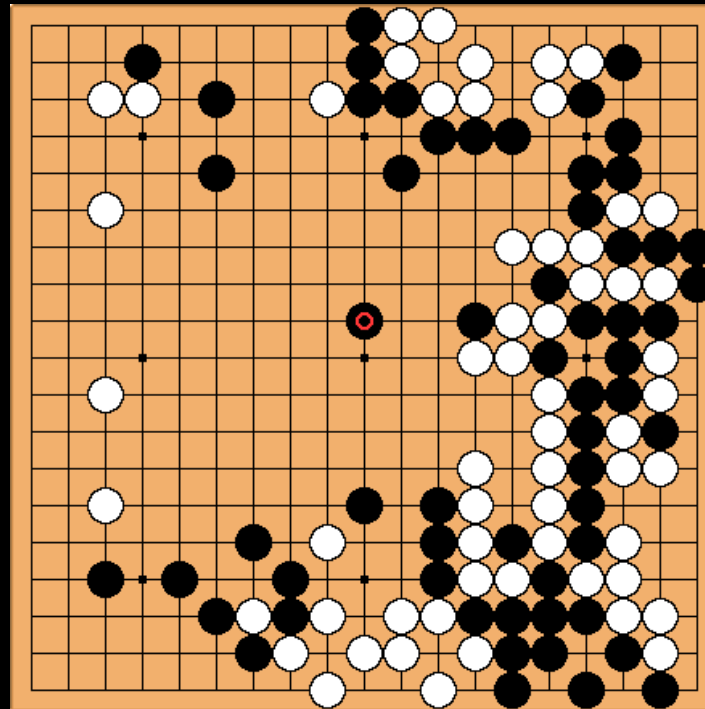


Model-free
reinforcement learning

Habitual actions

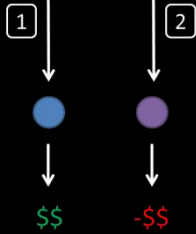


Reinforcement learning

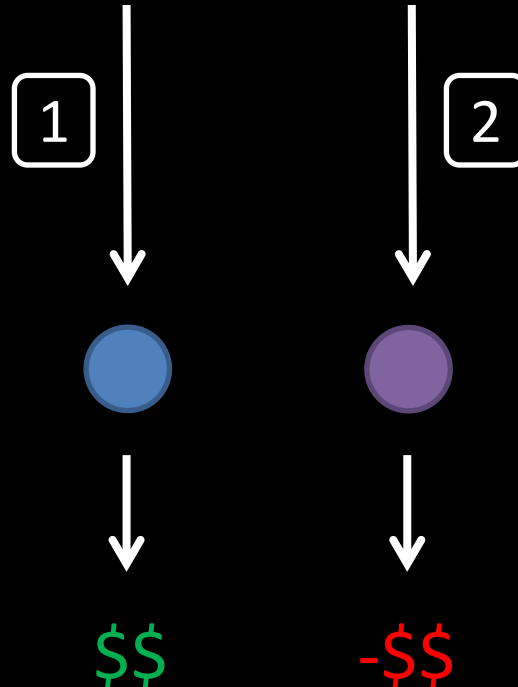


(Silver, Sutton, & Muhler 2012)

Reinforcement learning



Model-based
reinforcement learning



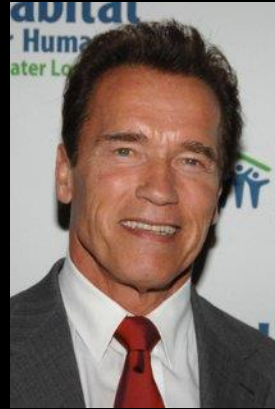
Model-free
reinforcement learning

Goal of  good

Goal of  bad

**Model-free goal
selection?**

Distinguishing MB & MF



1



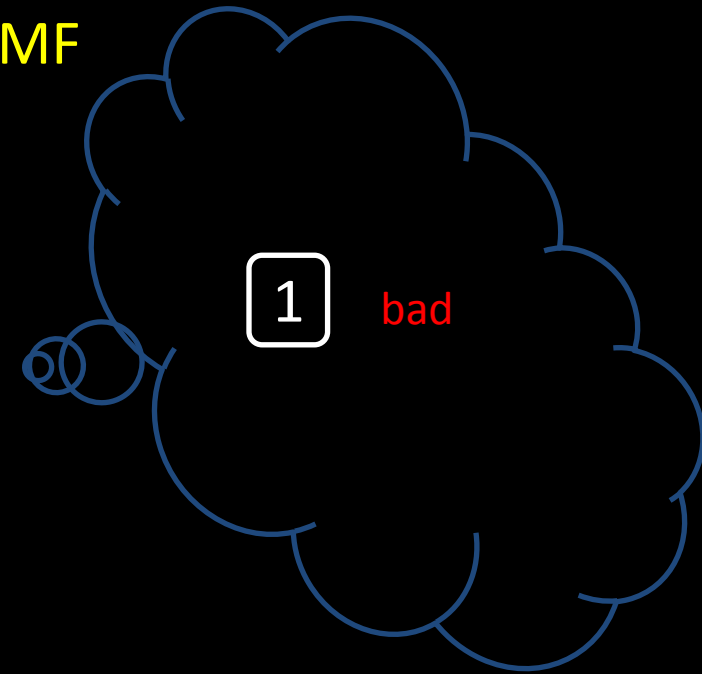
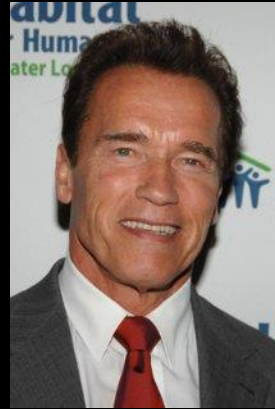
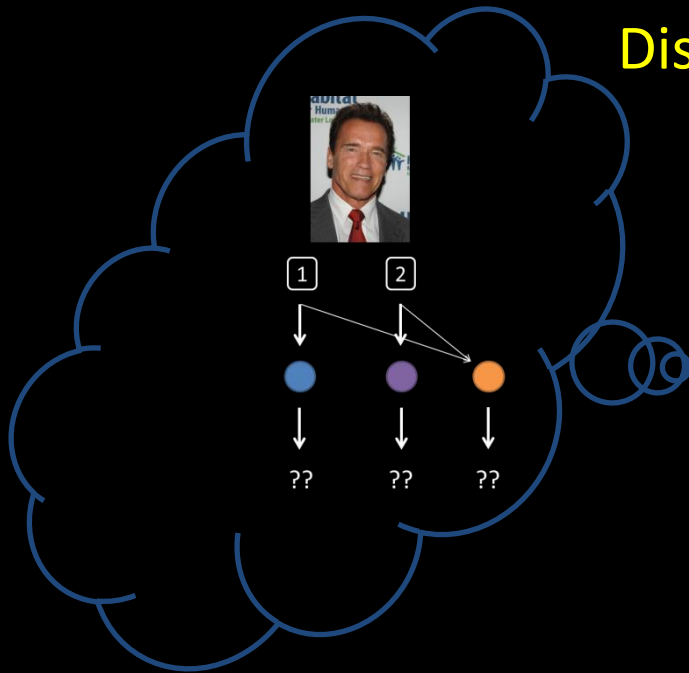
??

2

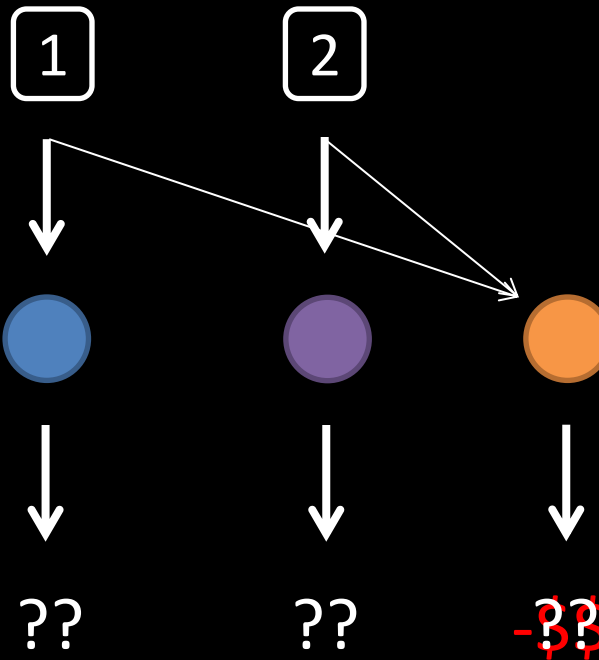


??

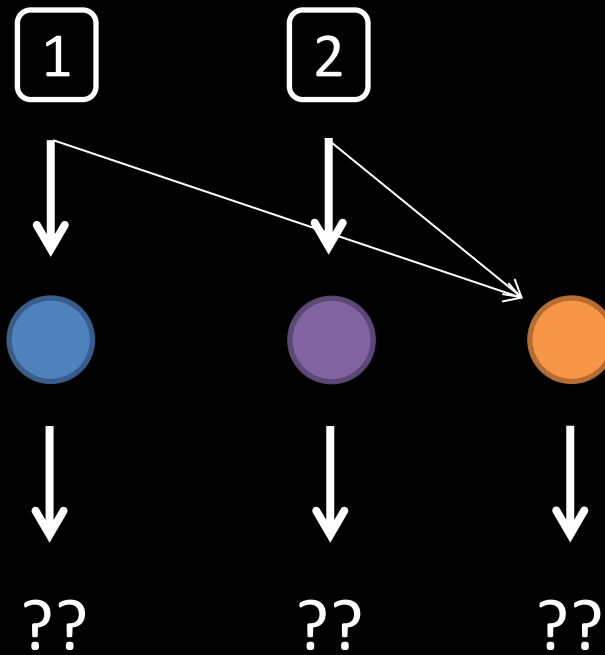
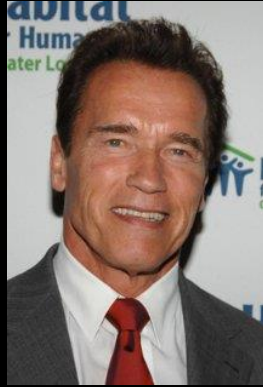
Distinguishing MB & MF



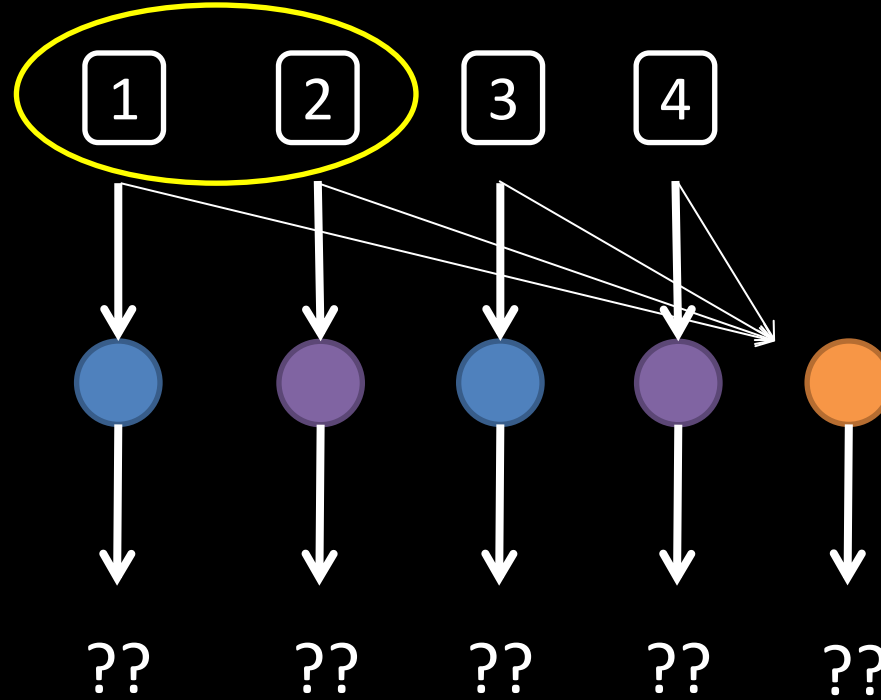
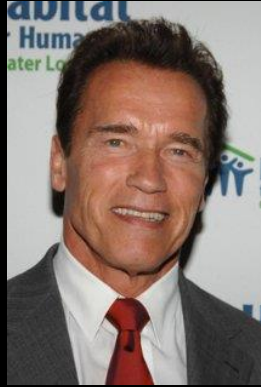
Goal of  bad



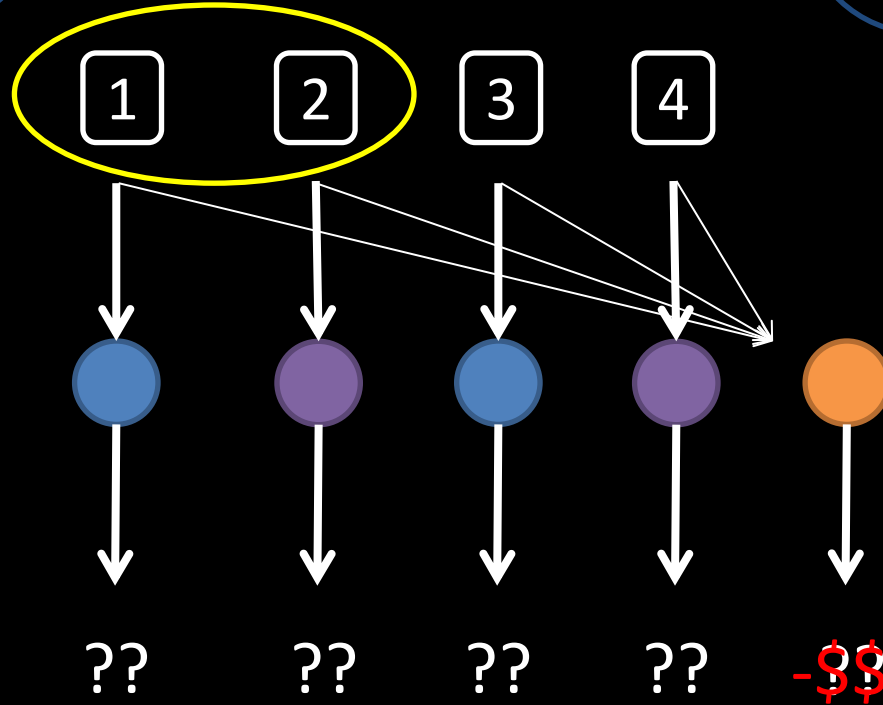
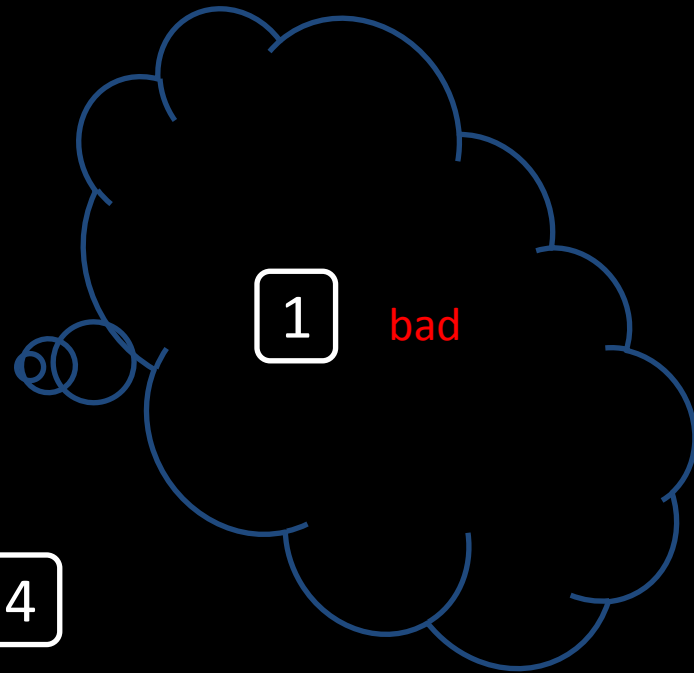
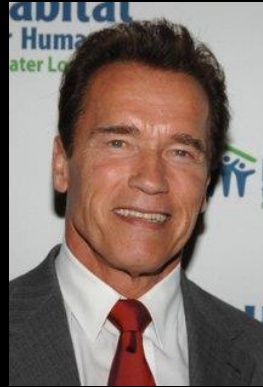
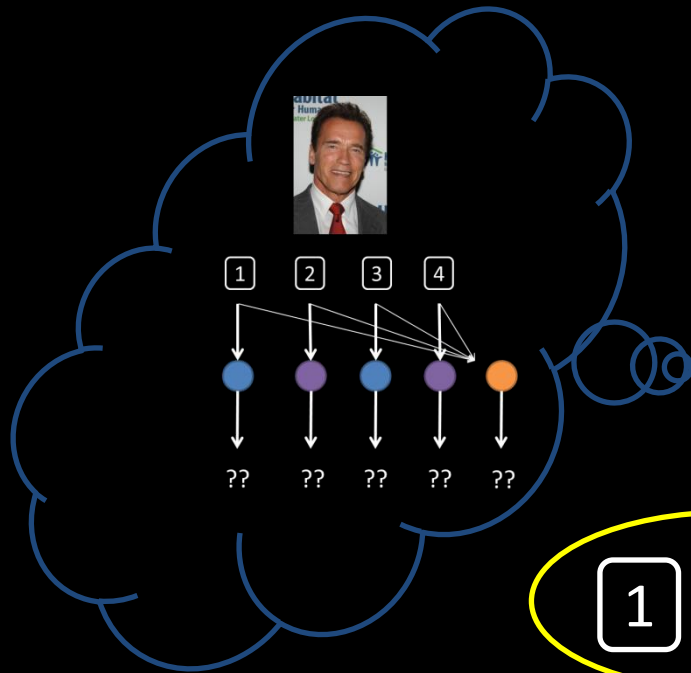
Our experiment



Our experiment

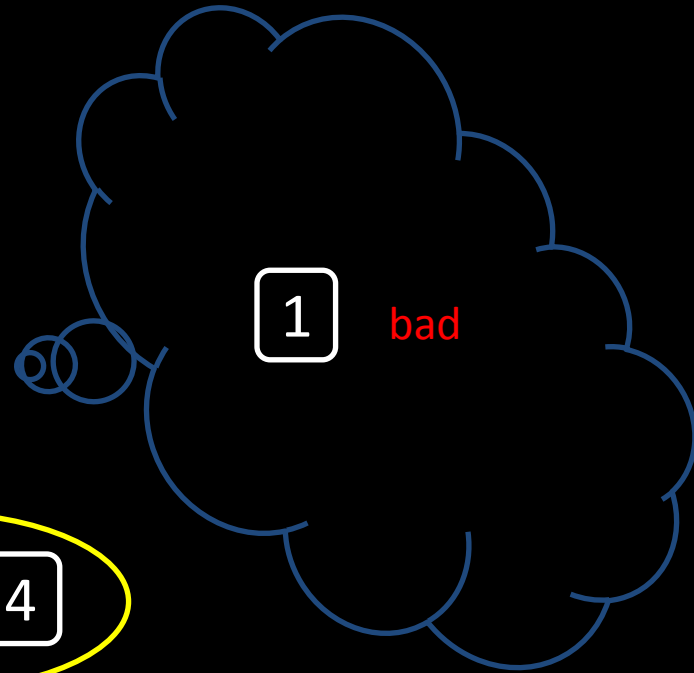
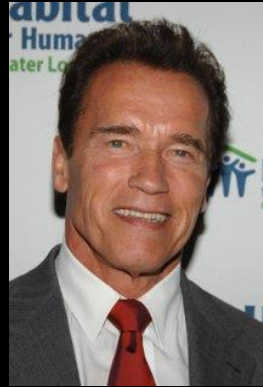
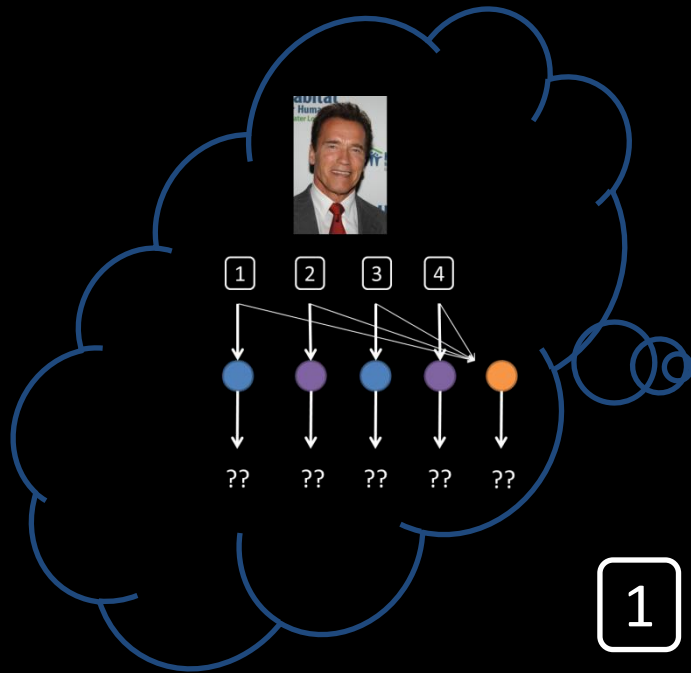


Our experiment

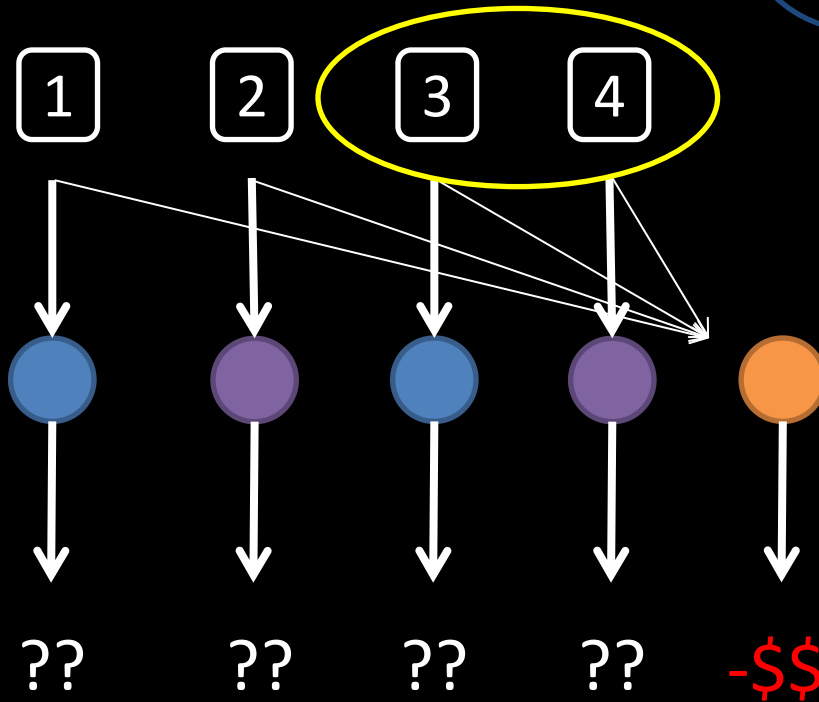


Goal of  **bad**

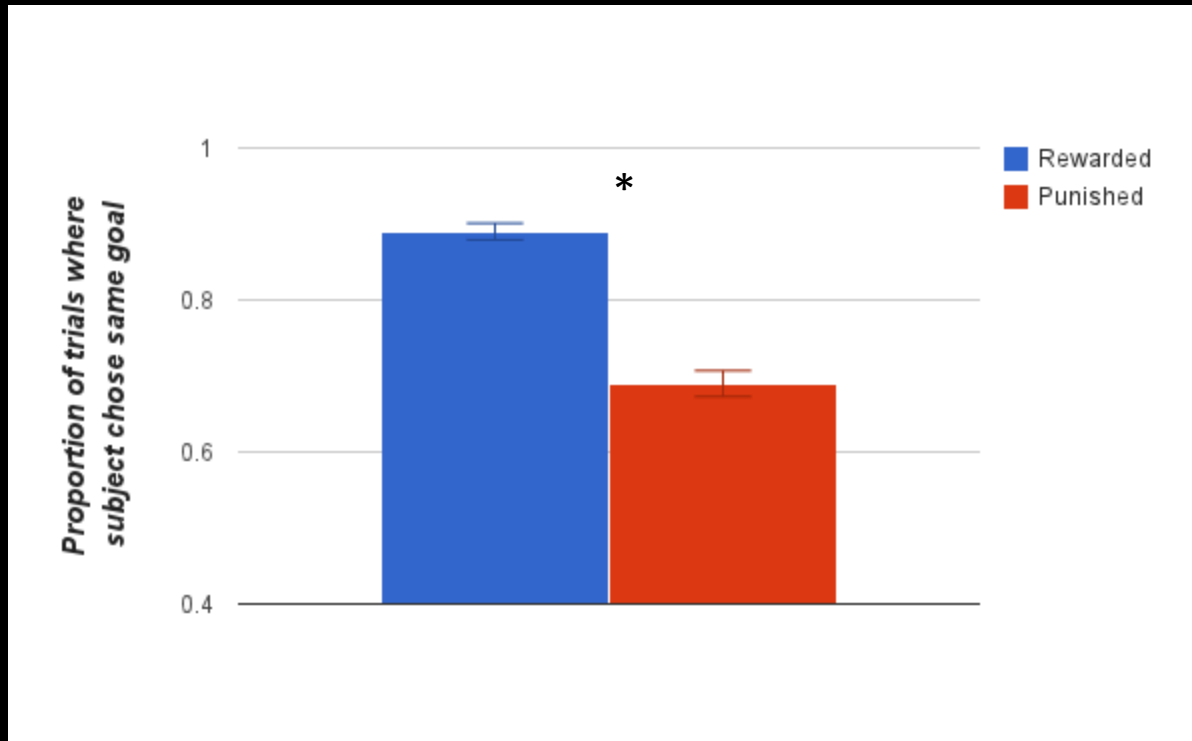
Our experiment



Goal of  bad



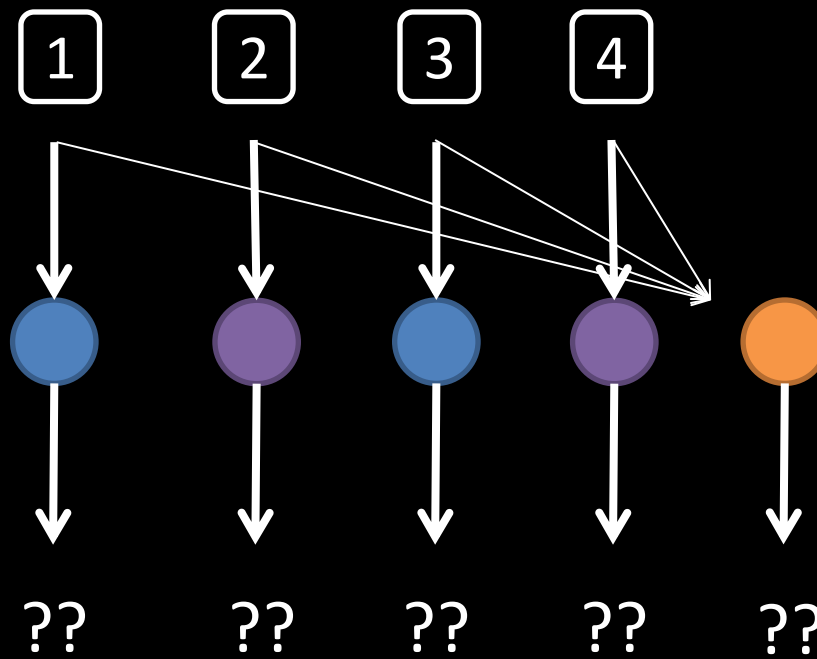
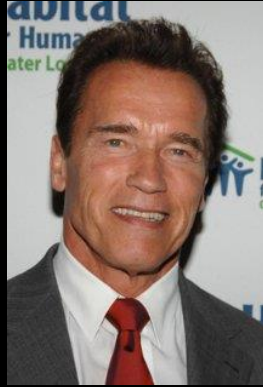
Our experiment



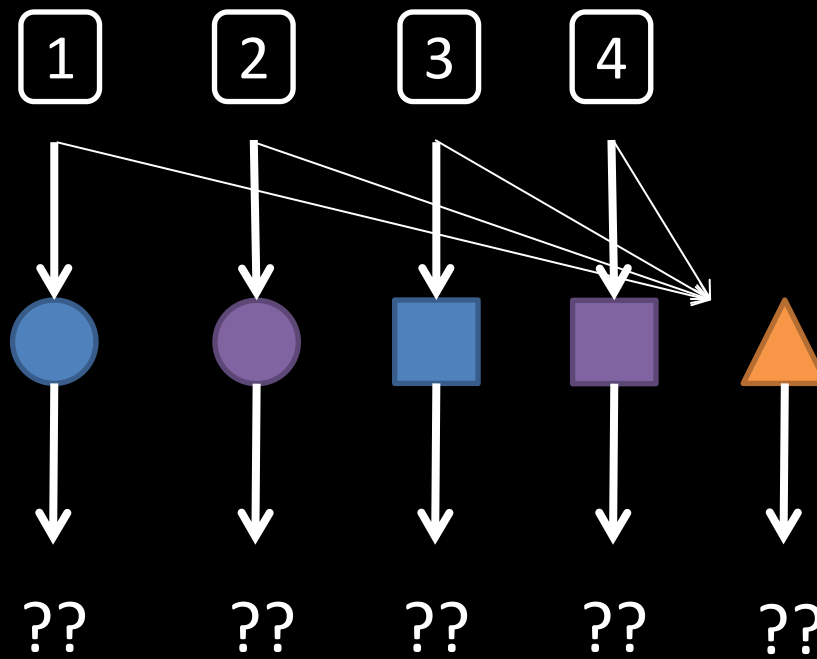
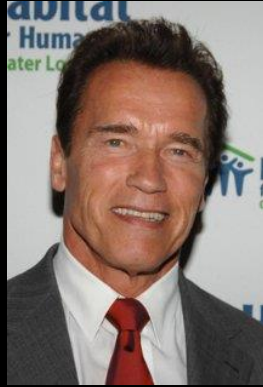
Orange's value → Choice on next trial

$$\beta = .191, p < .0001$$

Experiment #2



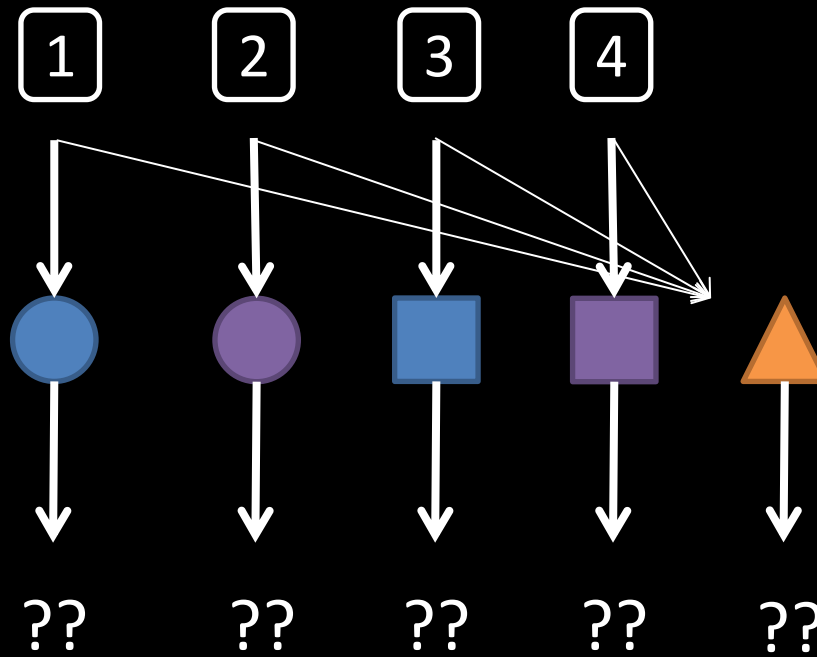
Experiment #2



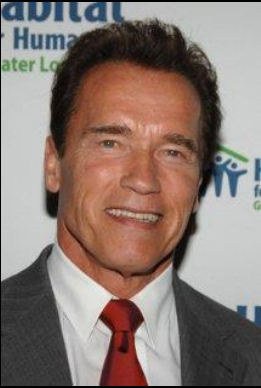
Experiment #2



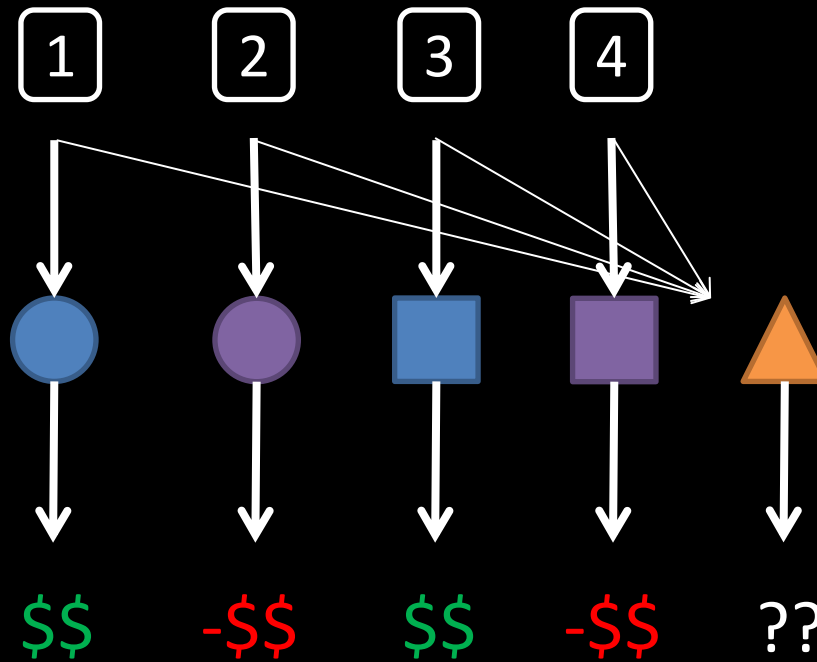
Color trial



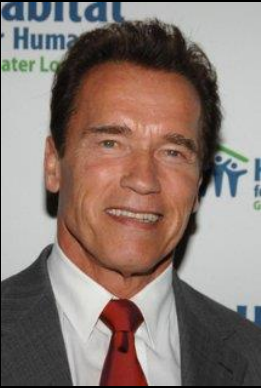
Experiment #2



Color trial

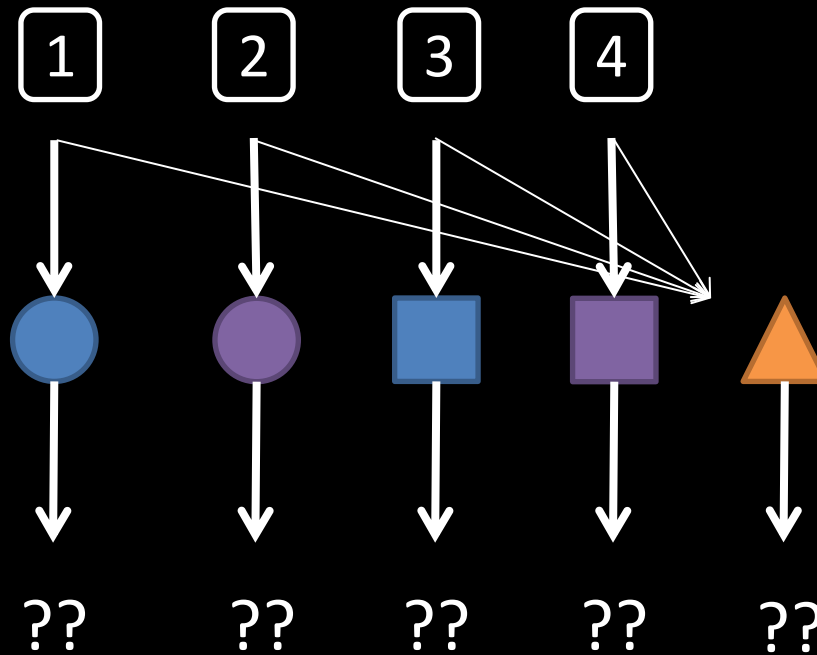


Experiment #2

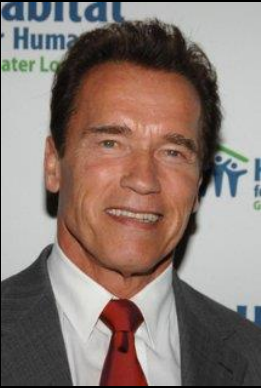


Color trial

Shape trial

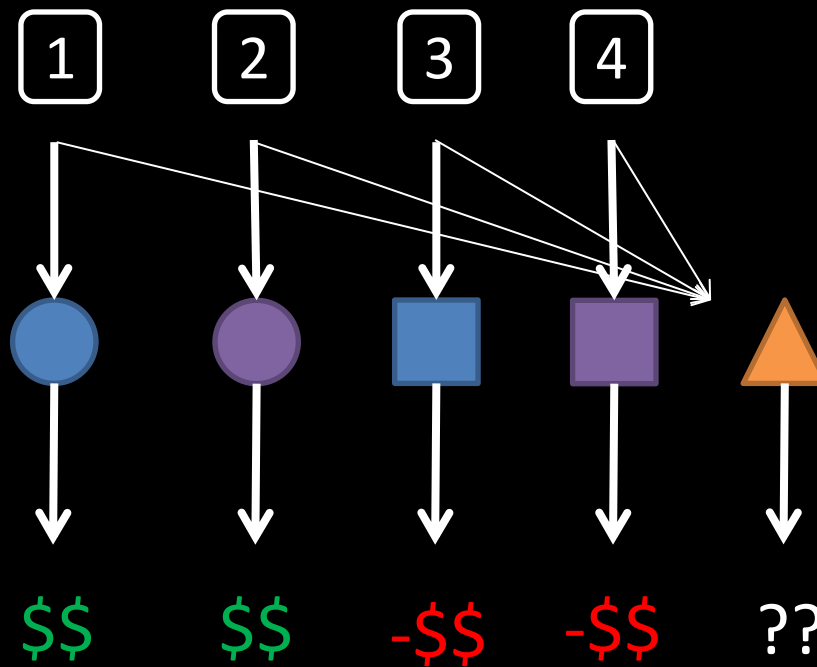


Experiment #2

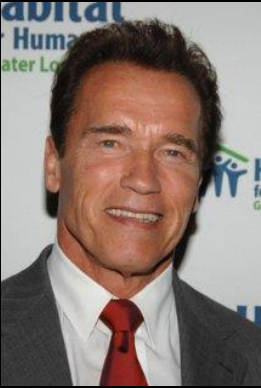


Color trial

Shape trial

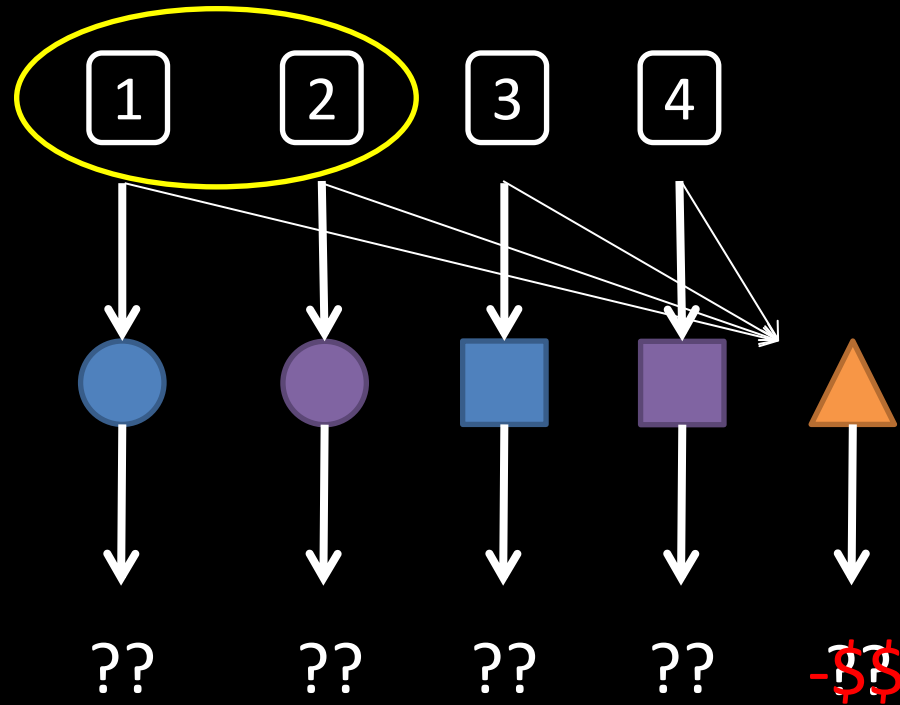


Experiment #2

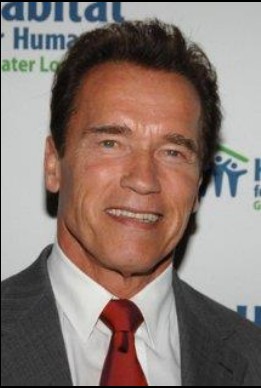


Color trial

Shape trial

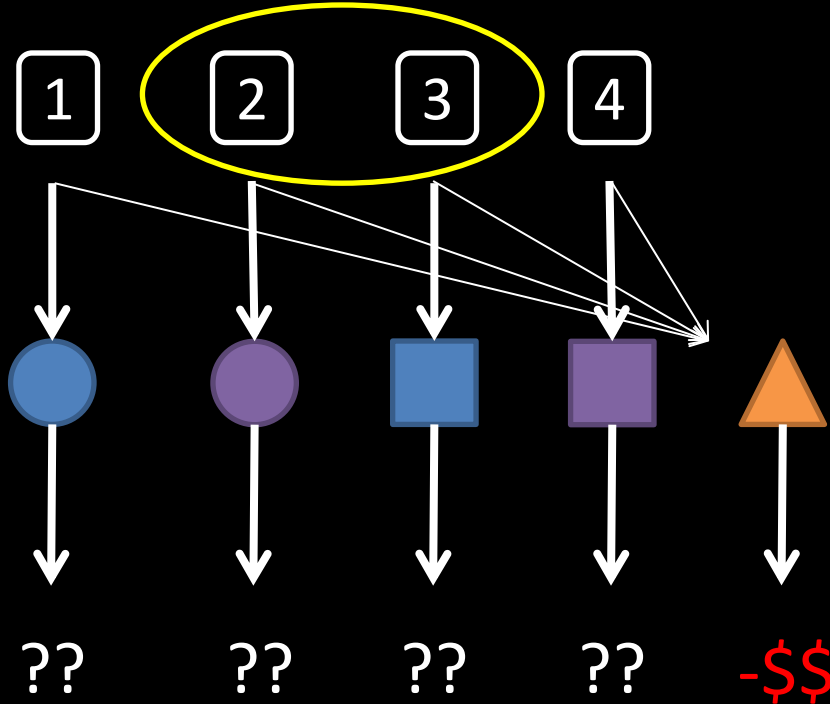
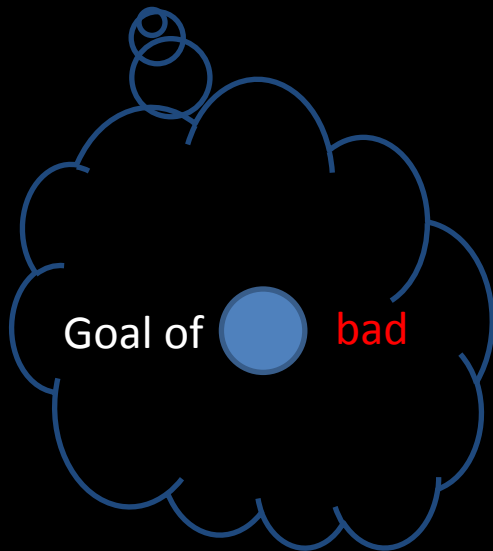


Experiment #2



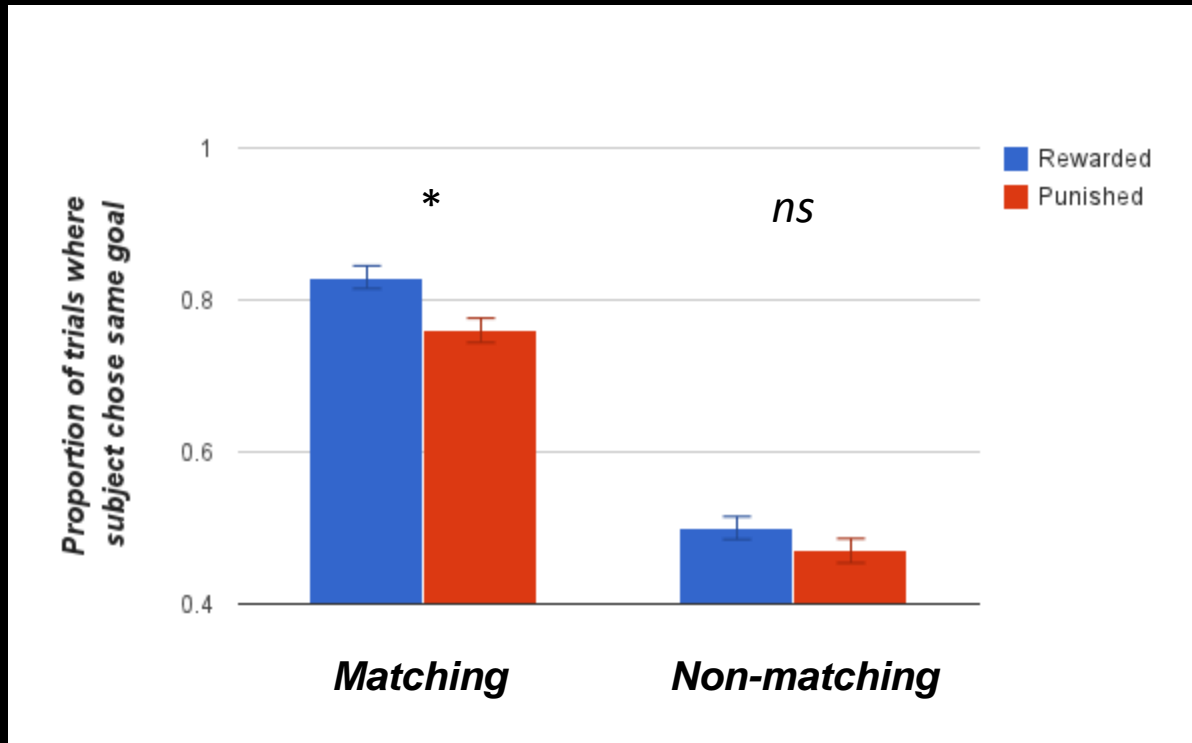
Color trial

Shape trial



Prediction: We'll only see the effect on "matching" critical trials.

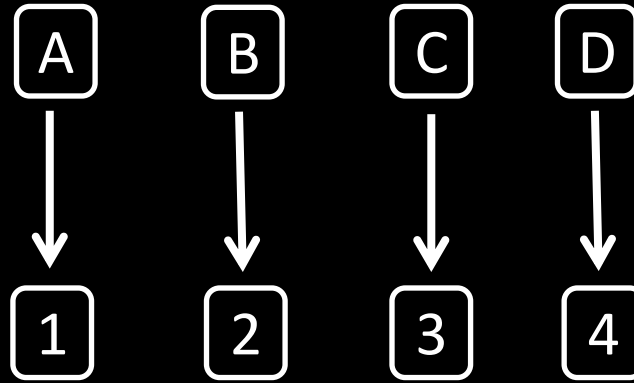
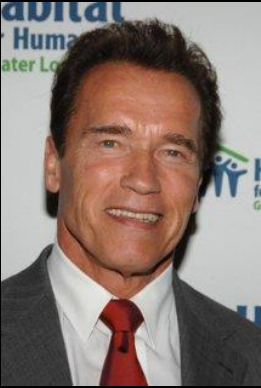
Experiment #2



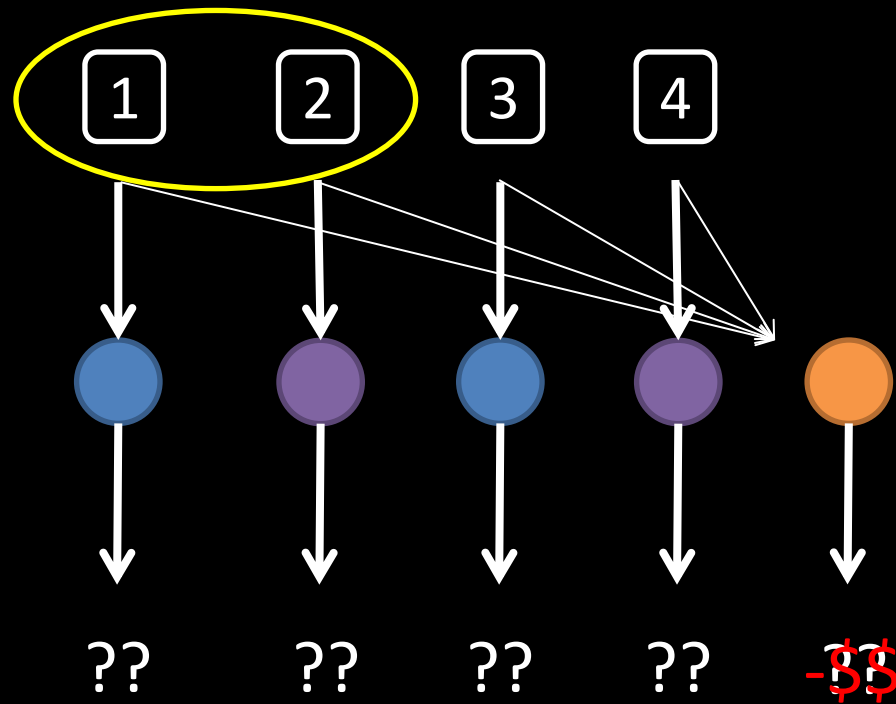
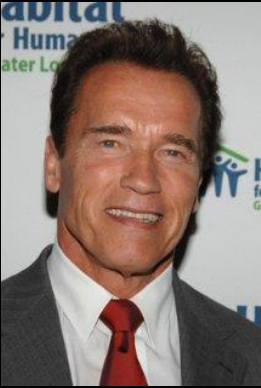
Orange's value * Type of critical trial → Choice on next trial

$$\beta = .049, p < .01$$

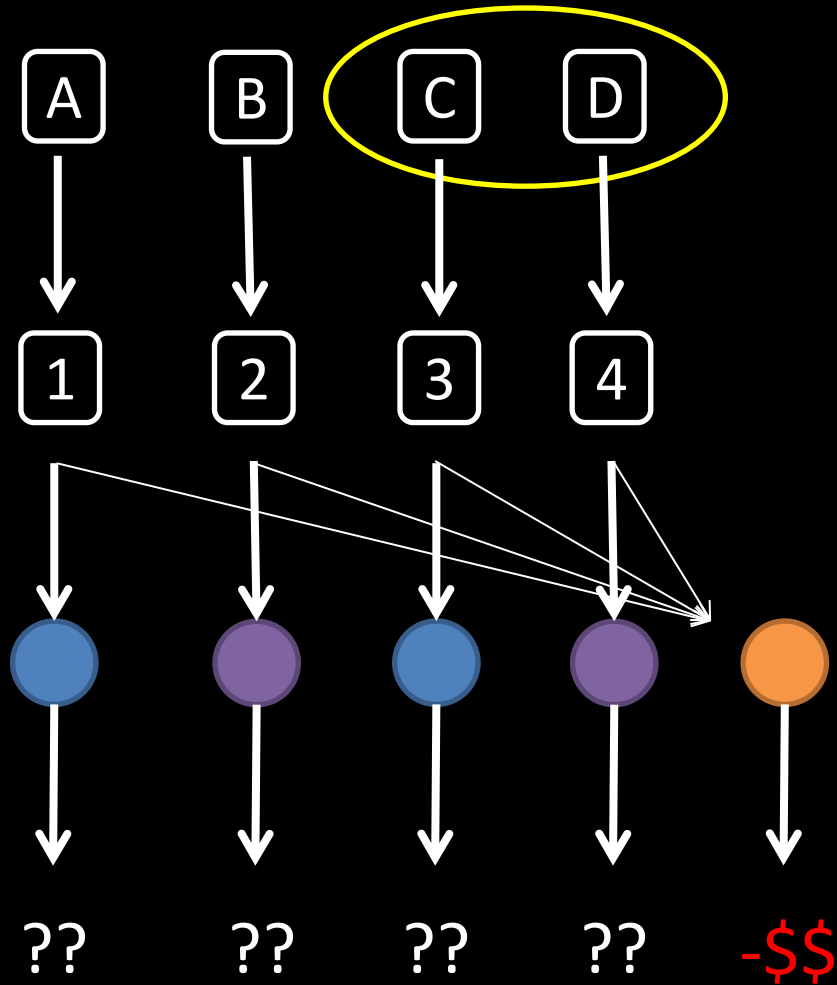
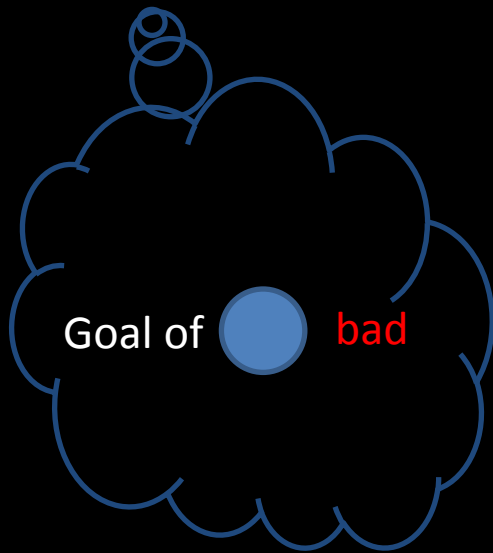
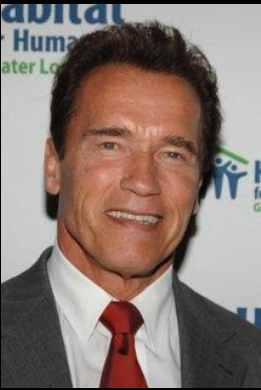
Experiment #3



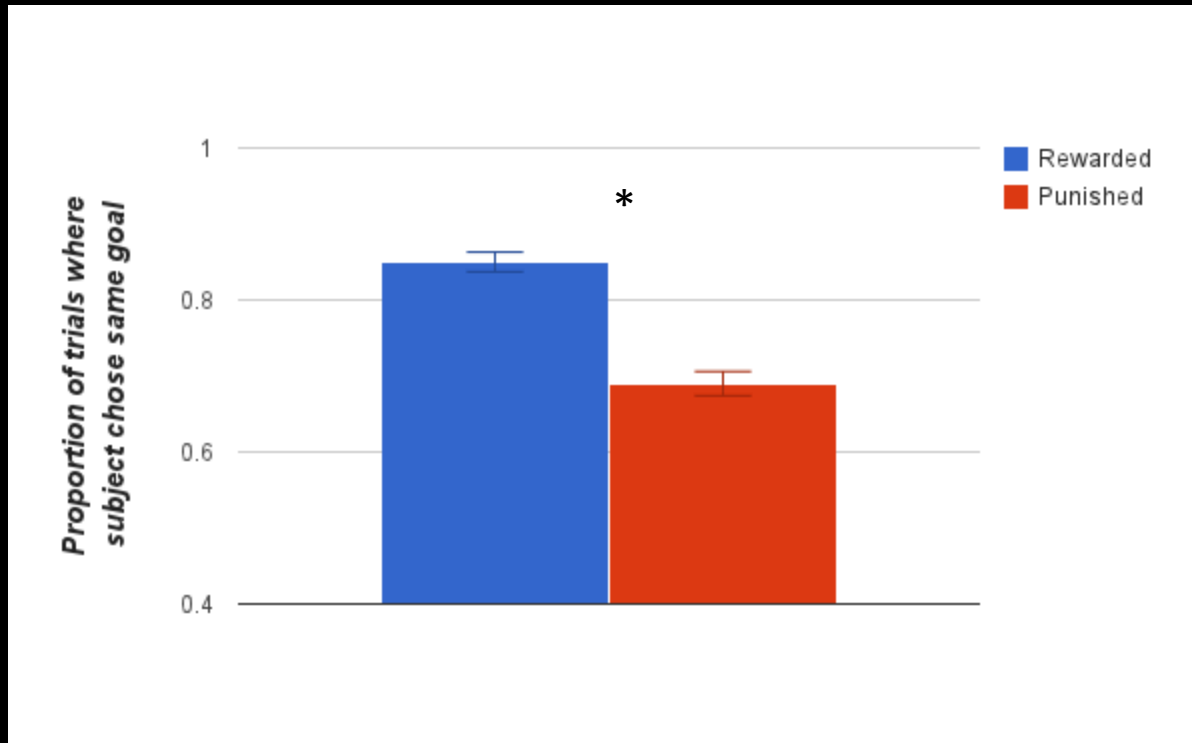
Experiment #3



Experiment #3



Experiment #3



Orange's value → Choice on next trial

$$\beta = .143, p < .0001$$

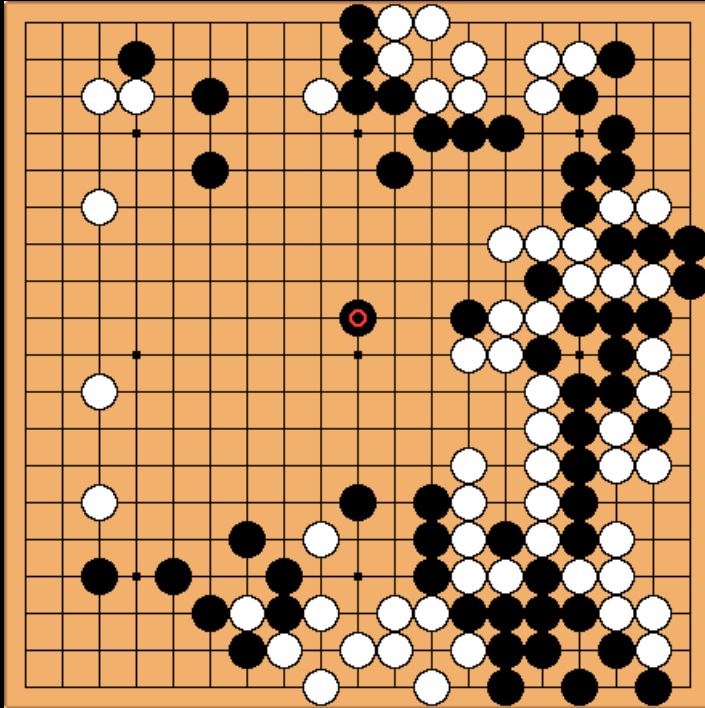
Psychological Phenomena

Habit-like features of goals (Huang & Bargh 2014)



| | |
|-------------|---|
| Divide: | $\begin{array}{r} 2 \\ 3 \overline{) 75} \end{array}$ <p>3 goes into 7 2 times... with some extra!</p> |
| Multiply: | $\begin{array}{r} 2 \\ 3 \overline{) 75} \\ \underline{6} \end{array}$ <p>$2 \times 3 = 6$</p> |
| Subtract: | $\begin{array}{r} 2 \\ 3 \overline{) 75} \\ \underline{-6} \\ 1 \end{array}$ |
| Bring Down: | $\begin{array}{r} 2 \\ 3 \overline{) 75} \\ \underline{-6} \\ 15 \end{array}$ |
| Repeat: | $\begin{array}{r} 25 \\ 3 \overline{) 75} \\ \underline{-6} \\ 15 \\ \underline{-15} \\ 0 \end{array}$ <p>$15 \div 3 = 5$ $5 \times 3 = 15$</p> |

AI Implications



Thank you!

