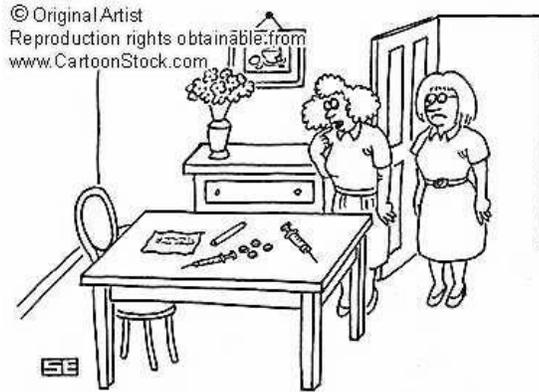


Instrumental Conditioning VI:

There is more than one kind of learning



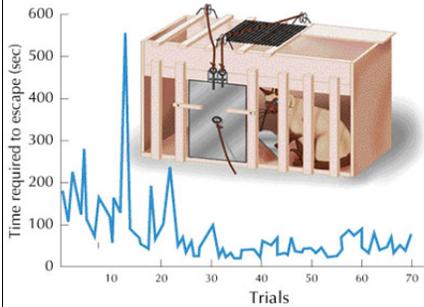
*"That's the thing when you start living with someone
– you discover all of their little habits."*

PSY/NEU338: Animal learning and decision making:
Psychological, computational and neural perspectives

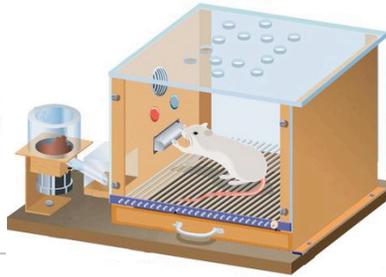
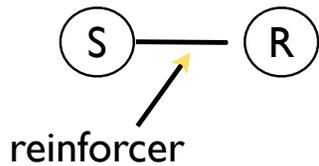
outline

- what goes into instrumental associations?
- goal directed versus habitual behavior
- neural dissociations between habitual and goal-directed behavior
- how does all this fit in with reinforcement learning?

what is associated with what?



Thorndike:

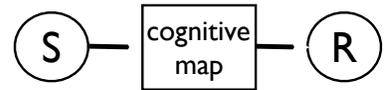


Skinner:

what is the S?



Tolman:



Tolman

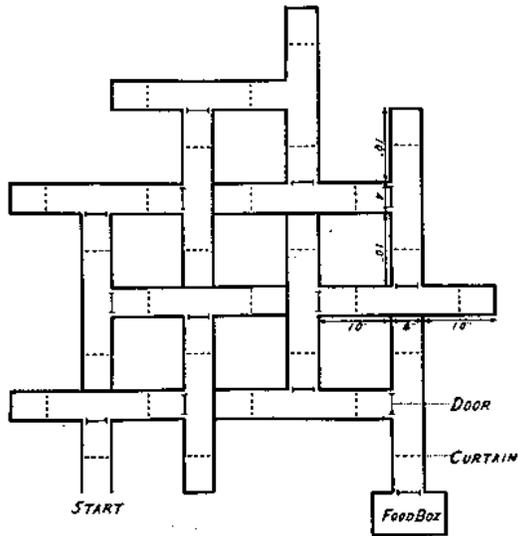
“The stimuli are not connected by just simple one-to-one switches to the outgoing responses. Rather, the incoming impulses are usually worked over and elaborated in the central control room into a tentative, cognitive-like map of the environment. And it is this tentative map, indicating routes and paths and environmental relationships, which finally determines what responses, if any, the animal will finally release.”



Tolman:



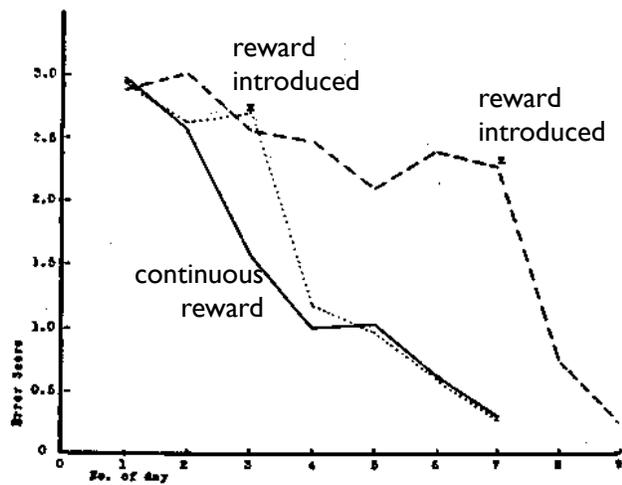
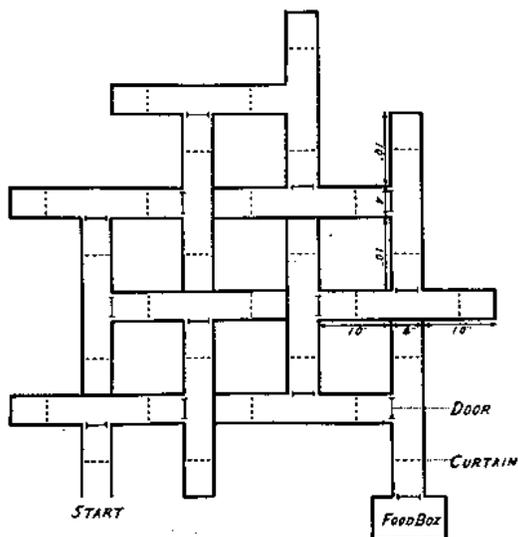
Maze task



- train rats to find food in a maze
- second group: exposed to maze but without food
- compare the groups in subsequent test with food
- what do you think will happen?
- what does this demonstrate?

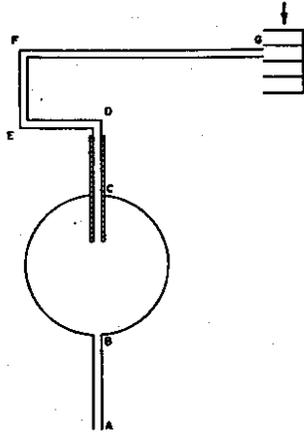
5

Maze task: Latent learning

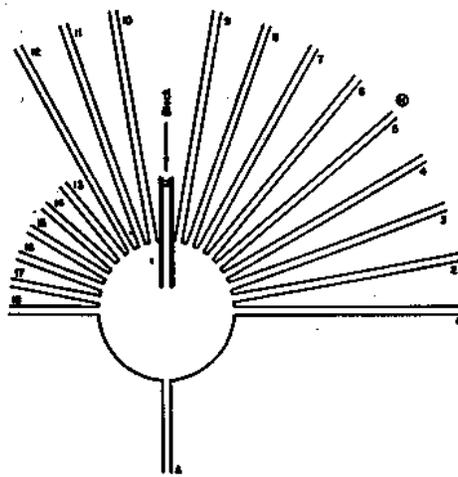


another example: shortcuts

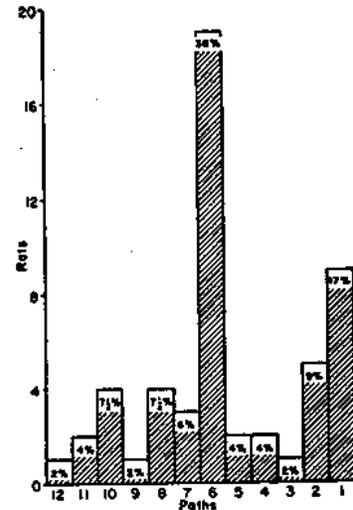
training:



test:



result:



Tolman et al (1946) 7

summary so far...

- Even the humble rat can learn & internally represent spatial structure, and use it to plan flexibly
- Tolman relates this to all of society
- Note that spatial tasks are really complicated & hard to control
- Next: search for modern versions of these effects
- Key question: is S-R model ever relevant? and what is there beyond it? (especially important given what we know about RL)

the modern debate: S-R vs R-O

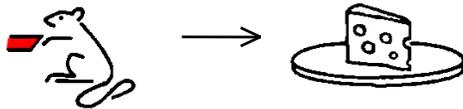
- S-R theory:
 - parsimonious - same theory for Pavlovian conditioning (CS associated with CR) and instrumental conditioning (stimulus associated with response)
 - but: the critical contingency in instrumental conditioning is that of the response and the outcome...
- alternative: R-O theory (also called A-O)
 - among proponents: Rescorla, Dickinson
 - same spirit as Tolman (know 'map' of contingencies and desires, can put 2+2 together)

How would you test this?

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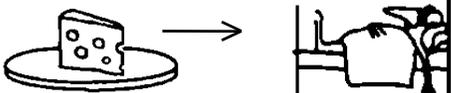
outcome devaluation

1 - Training:

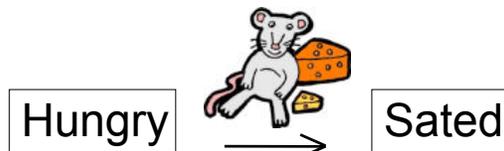


Q1: why test without rewards?
Q2: what do you think will happen?
Q3: what would Tolman/Thorndike guess?

2 - Pairing with illness:



2 - Motivational shift:



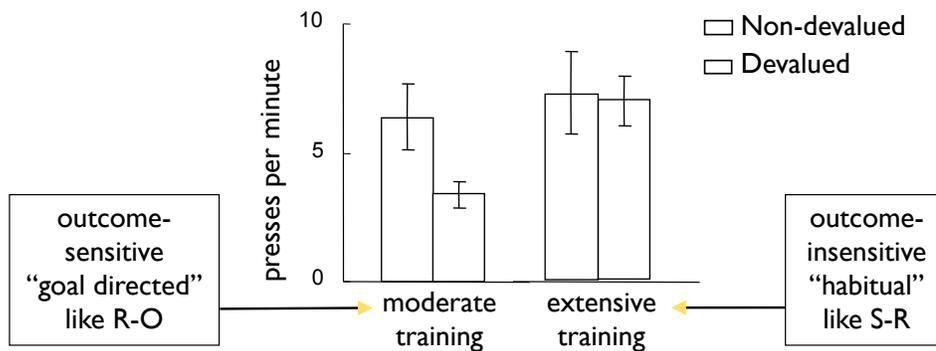
3 - Test:
(extinction)



will animals work for food they don't want?

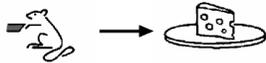
10

devaluation: results



Stage

1. training (hungry)



Animals will *sometimes* work for food they don't want!

2. devaluation



→ in daily life: actions become automatic (habitual) with repetition

3. test



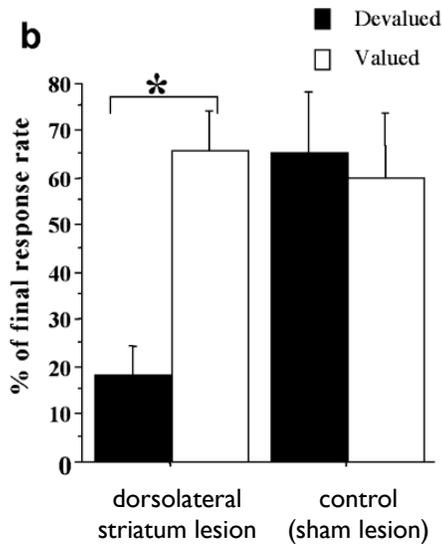
Holland (2004) 11

outline

- what goes into instrumental associations?
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devaluation: results from lesions I

overtrained rats



→ animals with lesions to DLS *never develop habits* despite extensive training

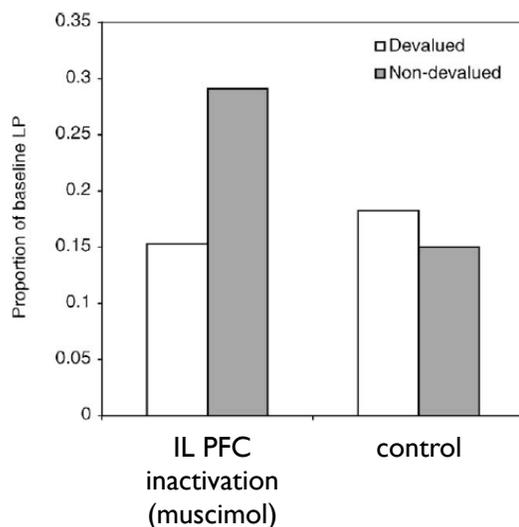
→ also treatments depleting dopamine in DLS

→ also lesions to infralimbic division of PFC (same corticostriatal loop)

Yin et al (2004) 13

devaluation: results from lesions II

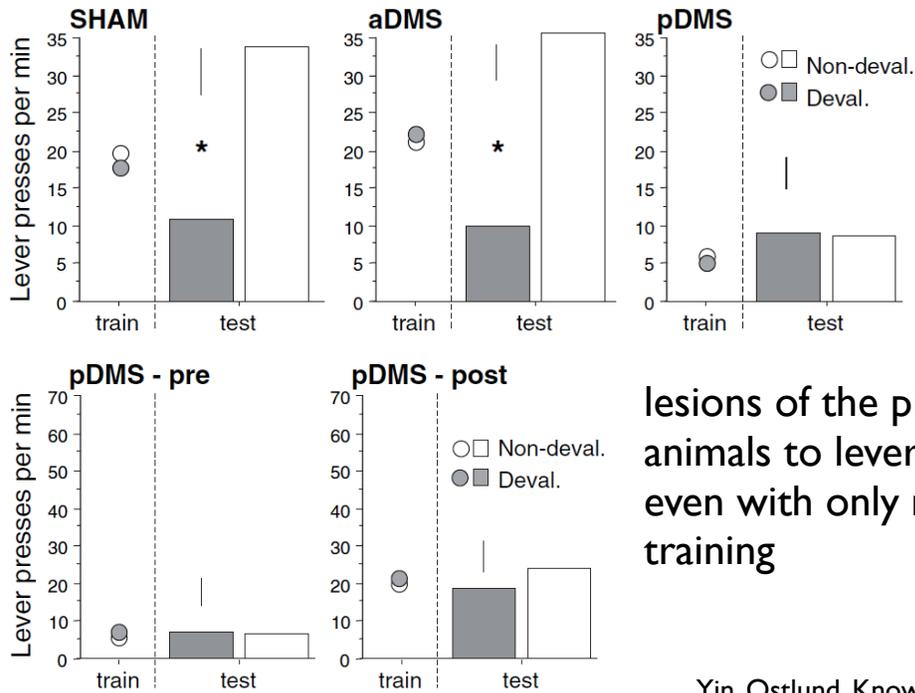
overtrained rats



after habits have been formed, devaluation sensitivity can be *reinstated* by temporary inactivation of IL PFC

Coutureau & Killcross (2003) 14

devaluation: results from lesions III

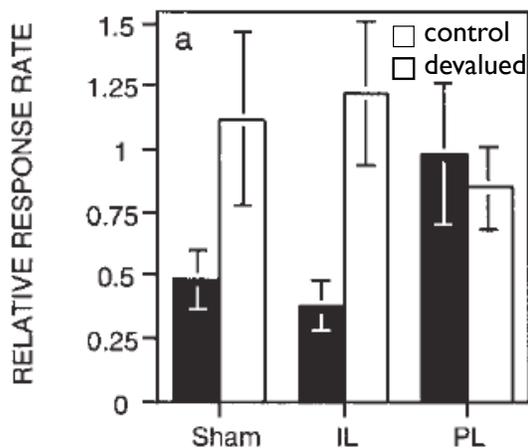


lesions of the pDMS cause animals to leverpress *habitually* even with only moderate training

Yin, Ostlund, Knowlton & Balleine (2005) 15

devaluation: results from lesions IV

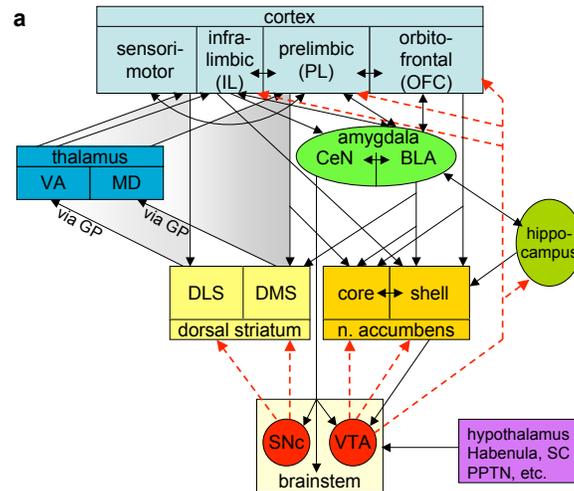
moderate training



Prelimbic (PL) PFC lesions cause animals to leverpress *habitually* even with only moderate training (also dorsomedial PFC and mediodorsal thalamus (same loop))

Killcross & Coutureau (2003) 16

complex picture of behavioral control



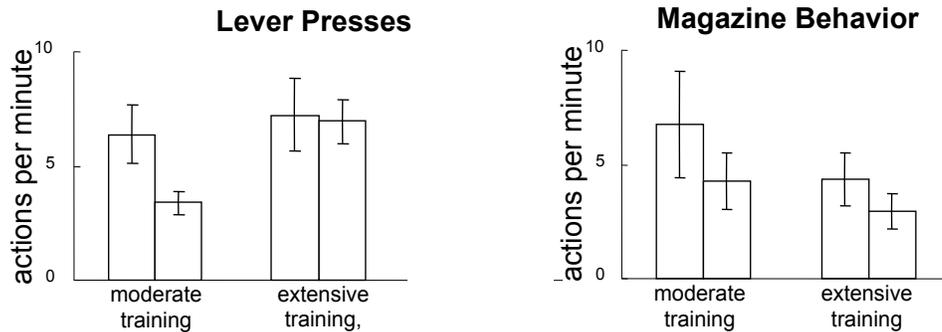
neural dissociation between goal-directed and habitual controllers

inspired by Balleine (2005) 17

what does all this mean?

- The same action (leverpressing) can arise from two psychologically & neurally dissociable pathways
 1. moderately trained behavior is “goal-directed”: dependent on outcome representation, like cognitive map (also associated with hippocampus - literal or abstract map of environment)
 2. overtrained behavior is “habitual”: apparently not dependent on outcome representation, like S-R
- S-R habits really *do* exist, they just don’t describe *all* of animal behavior
- Lesions suggest two parallel systems, in that the intact one can apparently support behavior at any stage

devaluation: one more result



behavior is not always consistent:
leverpressing is habitual and continues for unwanted food...
...at same time nosepoking is reduced (explanations?)

Kilcross & Coutureau (2003) 19

why are nosepokes always sensitive to devaluation?

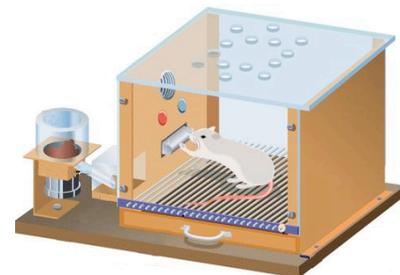
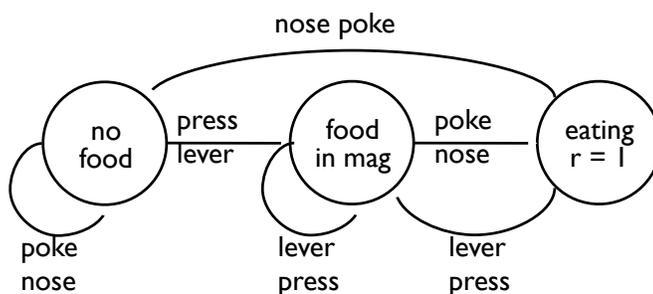
- Balleine & Dickinson: 3rd system - Pavlovian behavior is directly sensitive to outcome value
- But: doesn't make sense... the Pavlovian system has information that it is withholding from the instrumental system?
- Also.. true for purely instrumental chain
- And anyway, it seems that all the information is around all the time, so why is behavior not always goal-directed?

outline

- what goes into instrumental associations?
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back to RL framework for decisions

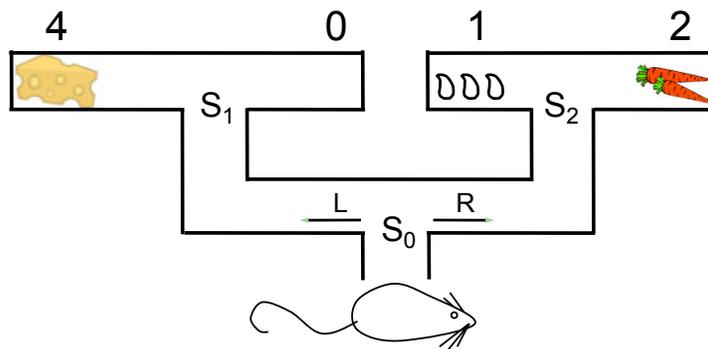


3 states: "no food", "food in mag", "eating"
2 actions: "press lever", "poke nose"
immediate reward is 1 in state "eating" and 0 otherwise

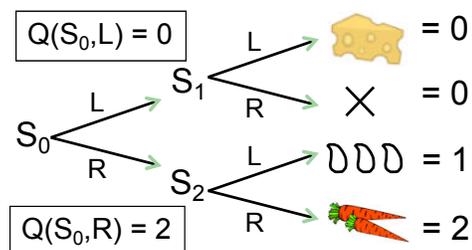
need to know long term consequences of actions $Q(S,a)$ in order to choose the best one
how can these be learned?

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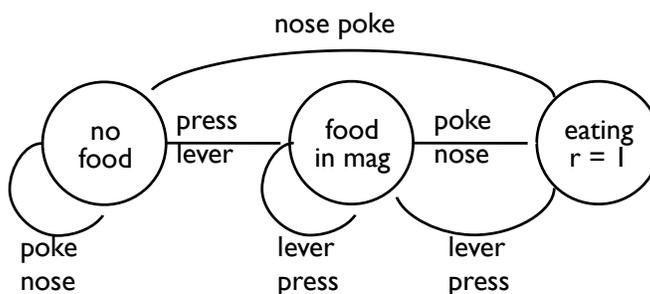
strategy I: "model-based" RL



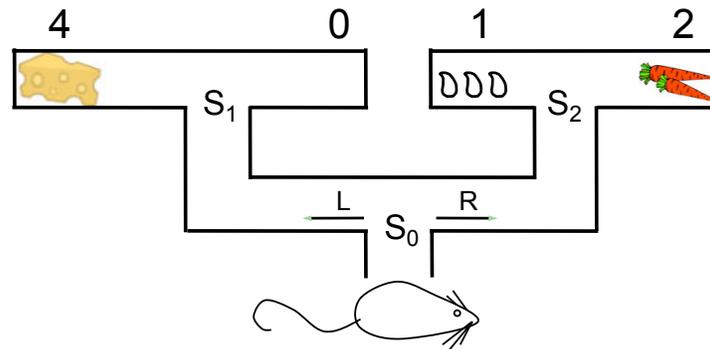
learn model of task through experience
 (= cognitive map)
 compute Q values by "looking ahead" in
 the map
 computationally costly, but also flexible
 (immediately sensitive to change)



strategy I: "model-based" RL



strategy II: “model-free” RL



- Shortcut: store long-term values
 - then simply retrieve them to choose action
- Can learn these from experience
 - without building or searching a model
 - incrementally through prediction errors
 - dopamine dependent SARSA/Q-learning or Actor/Critic

Stored:

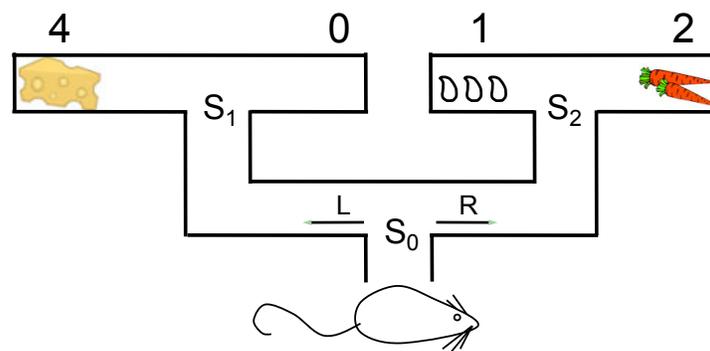
$Q(S_0, L) = 4$
 $Q(S_0, R) = 2$

$Q(S_1, L) = 4$
 $Q(S_1, R) = 0$

$Q(S_2, L) = 1$
 $Q(S_2, R) = 2$

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strategy II: “model-free” RL



- choosing actions is easy so behavior is quick, reflexive (S-R)
- but needs a lot of experience to learn
- and inflexible, need relearning to adapt to any change (habitual)

Stored:

$Q(S_0, L) = 4$
 $Q(S_0, R) = 2$

$Q(S_1, L) = 4$
 $Q(S_1, R) = 0$

$Q(S_2, L) = 1$
 $Q(S_2, R) = 2$

26

two big questions

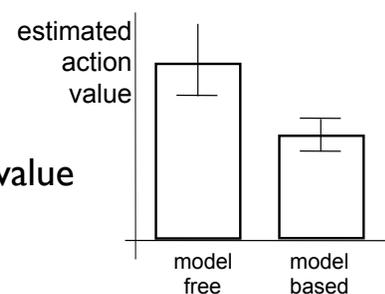
- Why should the brain use two different strategies/ controllers in parallel?
- If it uses two: how can it arbitrate between the two when they disagree (*new decision making problem...*)



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answers

- each system is best in different situations (use each one when it is most suitable/most accurate)
 - goal-directed (forward search) - good with limited training, close to the reward (don't have to search ahead too far)
 - habitual (cache) - good after much experience, distance from reward not so important
- arbitration: trust the system that is more confident in its recommendation
 - different sources of uncertainty in the two systems
 - compare to: always choose the highest value



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back to animals pressing a lever for a devalued food, but not nose-poking to get it: can you explain this?

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summary

- instrumental behavior is not a simple unitary phenomenon: the same behavior can result from different neural and computational origins
- different neural mechanisms work in parallel to support behavior: cooperation and competition
- useful tests: outcome devaluation, contingency degradation

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