

Human emotions

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Systems and Theoretical Neuroscience Course, 11/9/18

- ▶ Innate behaviours in humans
- ▶ Are emotions Pavlovian responses?
 - Theories of emotions
- ▶ Disorders of emotion

▶ Darwin

- The Expression of Emotions in Man and Animal
- Emotions = innate response strategies to evolutionarily important situations

▶ Pavlovian conditioning

- Not for all responses



▶ Basic emotions

- Innate, universal response categories
- Innate behaviours in humans?

Hershberger, 1986

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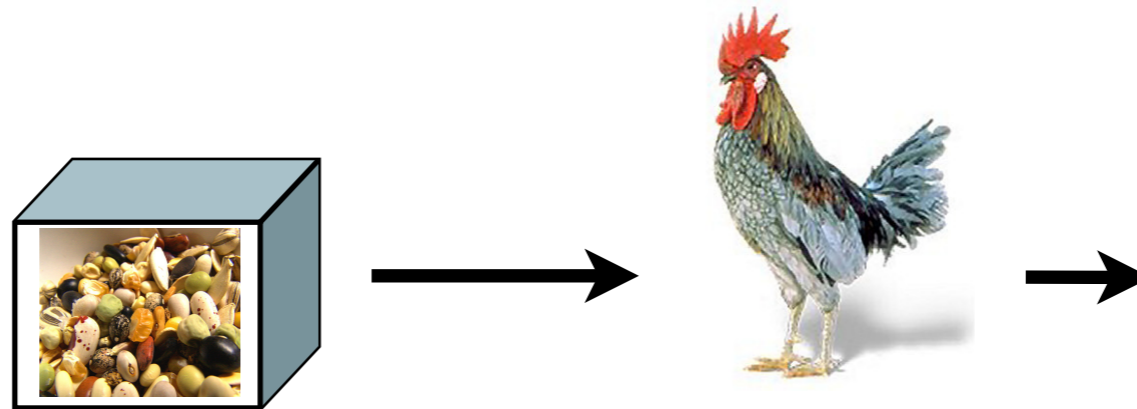
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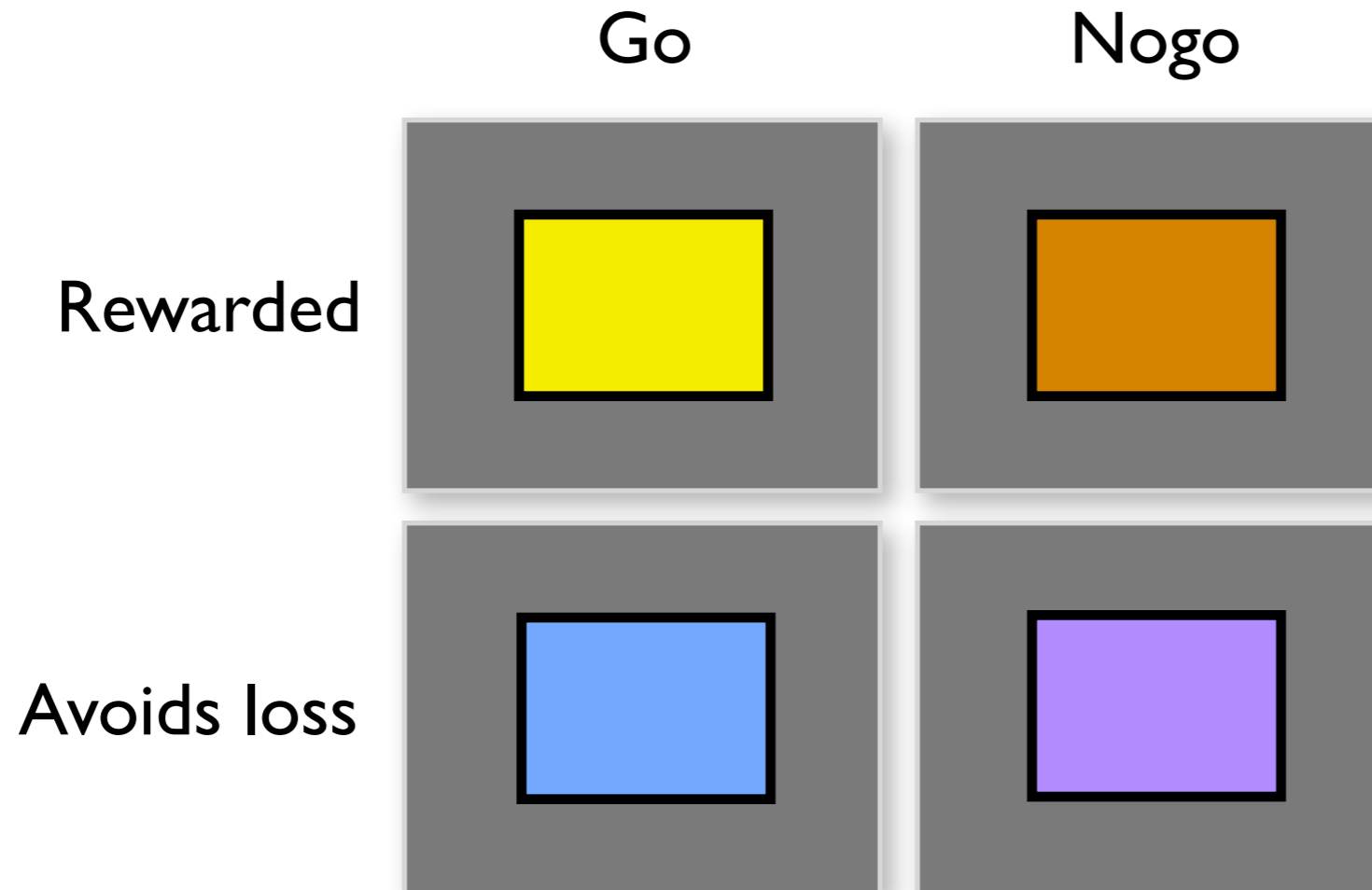
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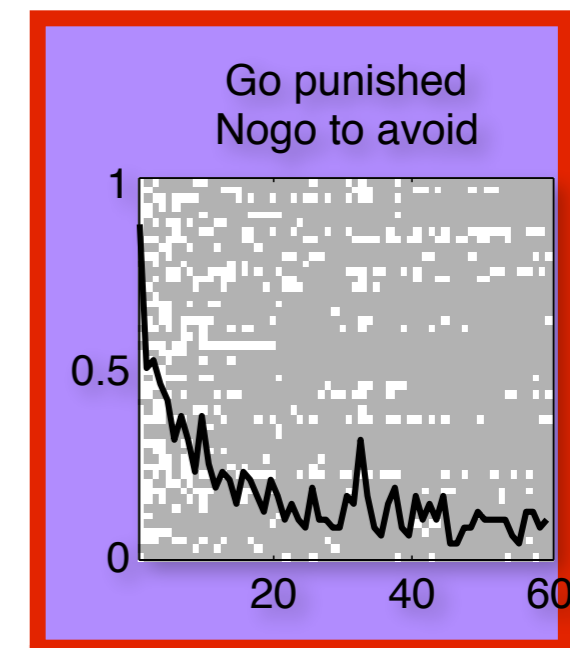
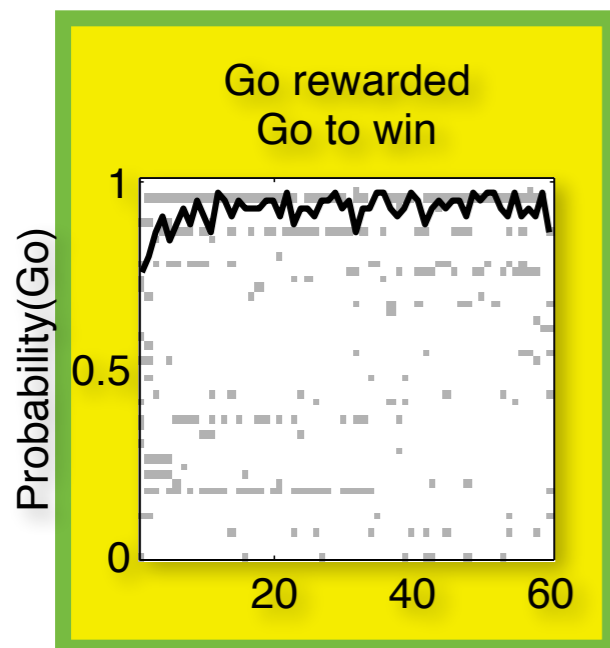
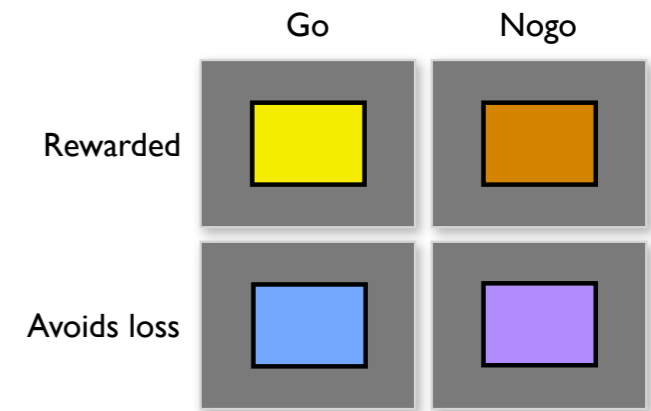
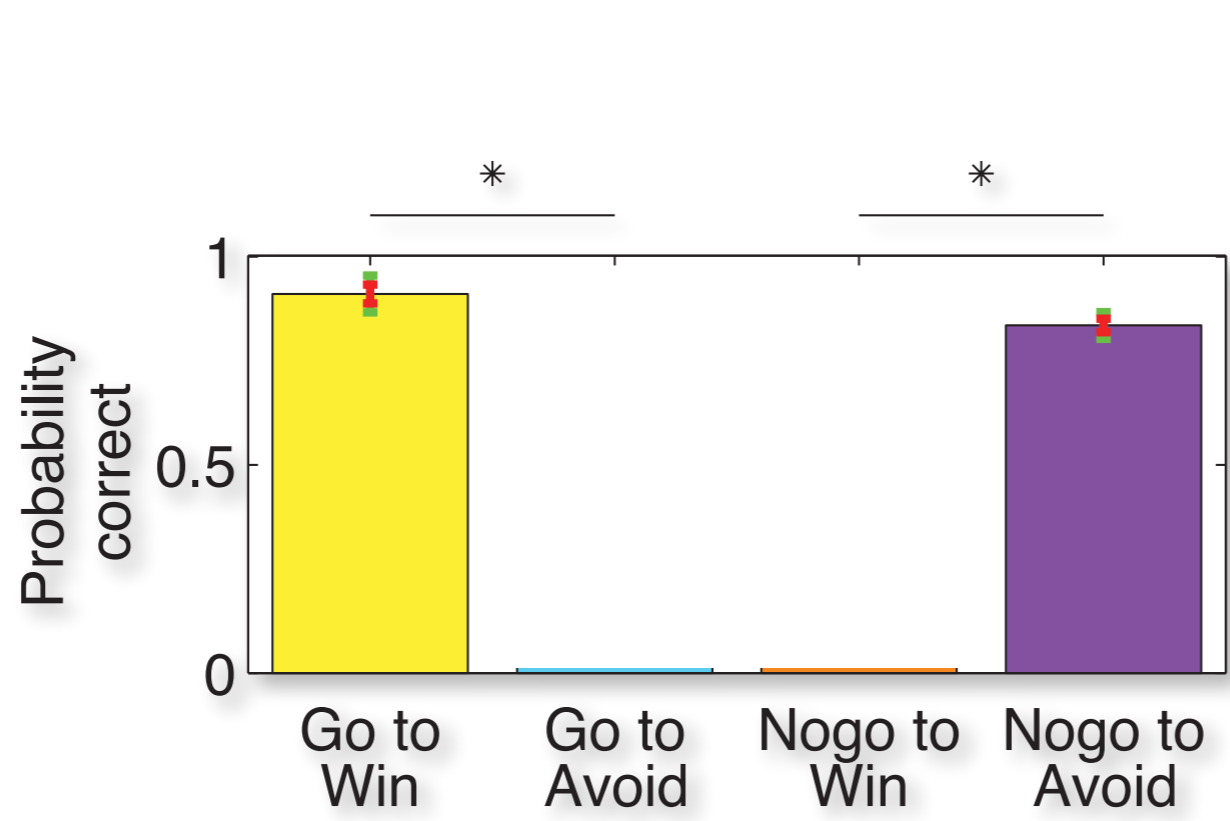
▶ Basic emotions

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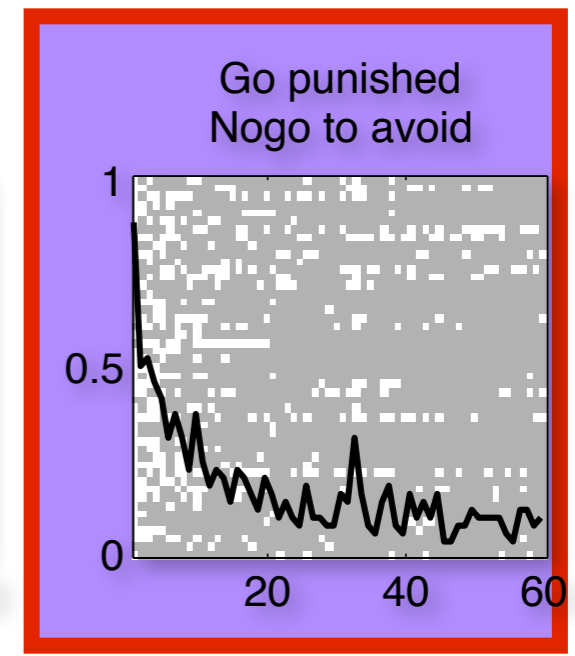
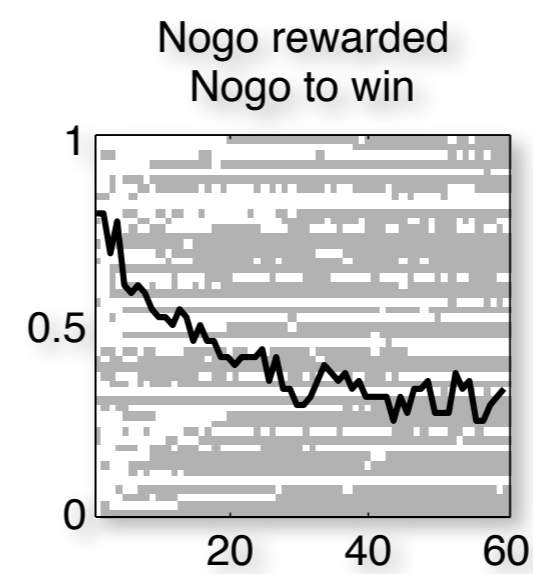
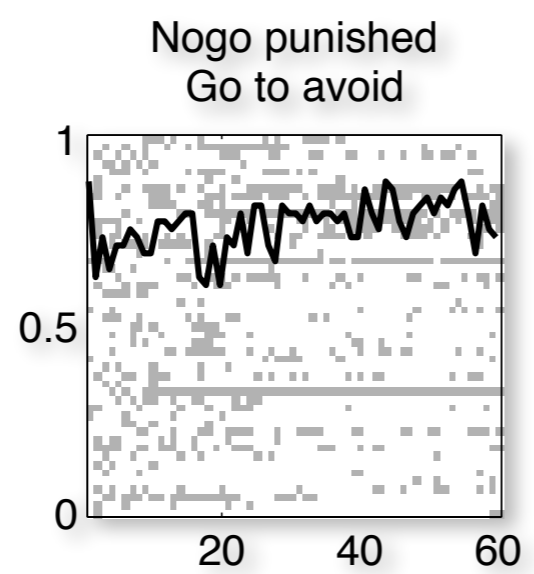
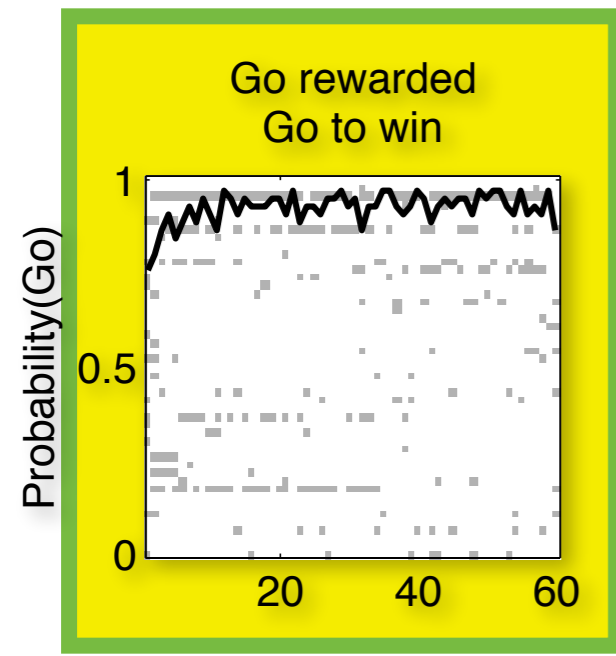
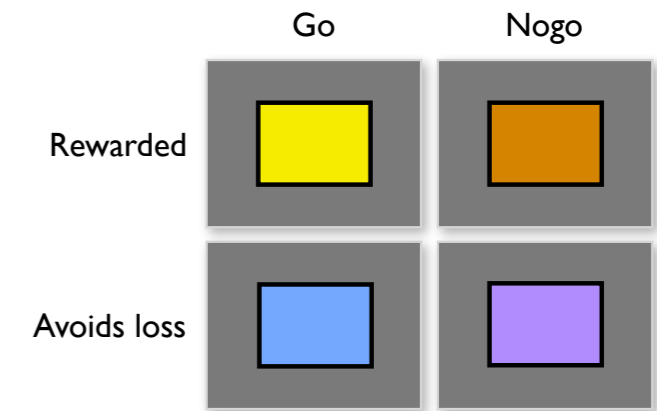
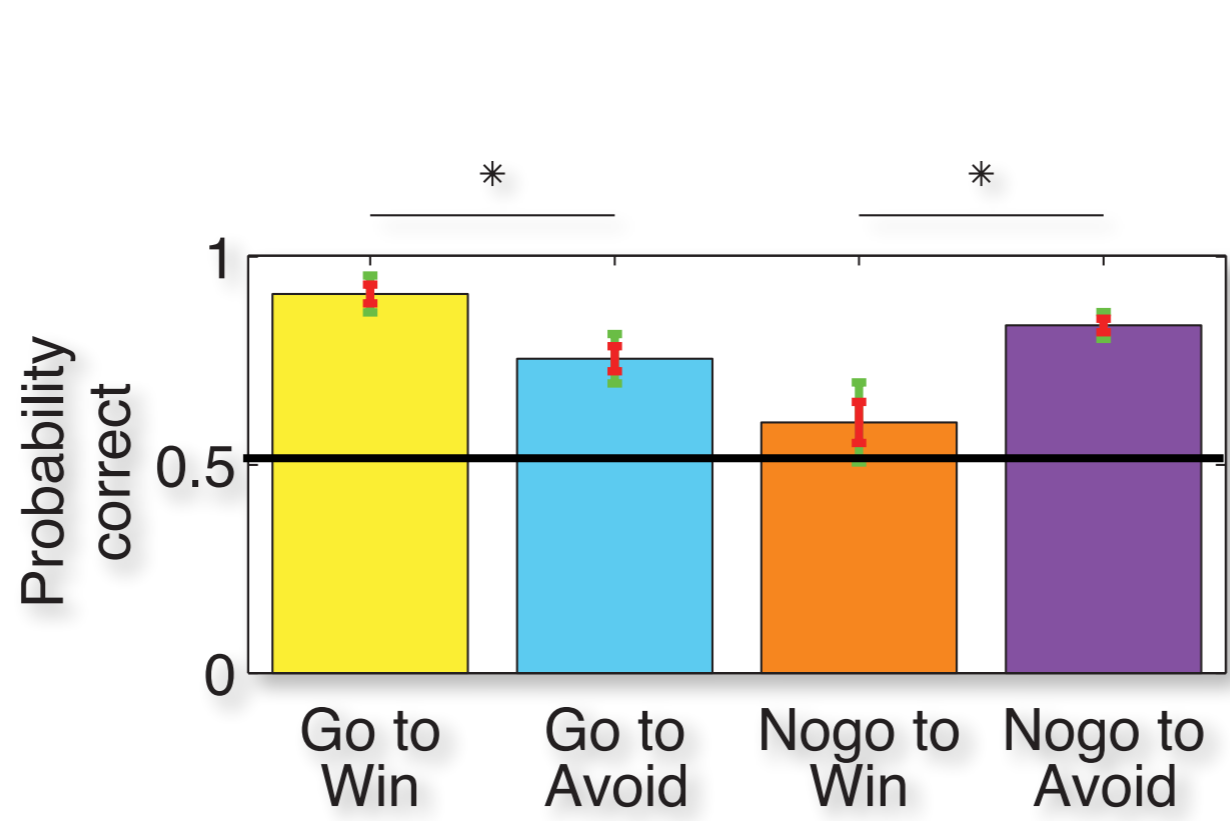


Affective go / nogo task



Guitart-Masip, Huys et al. 2012

Affective go / nogo task



Guitart-Masip, Huys et al. 2012

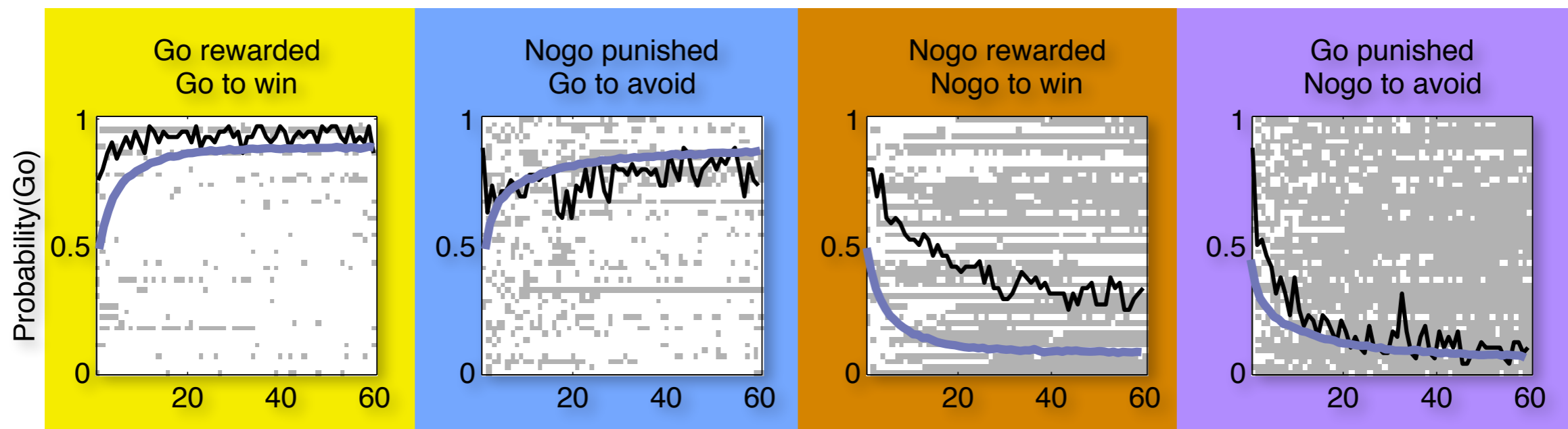
Models



► Basic

$$p_t(a|s) \propto Q_t(s, a)$$

$$Q_{t+1}(s, a) = Q_t(s, a) + \alpha(r_t - Q_t(s, a))$$



Guitart et al., 2012 J Neurosci

Models

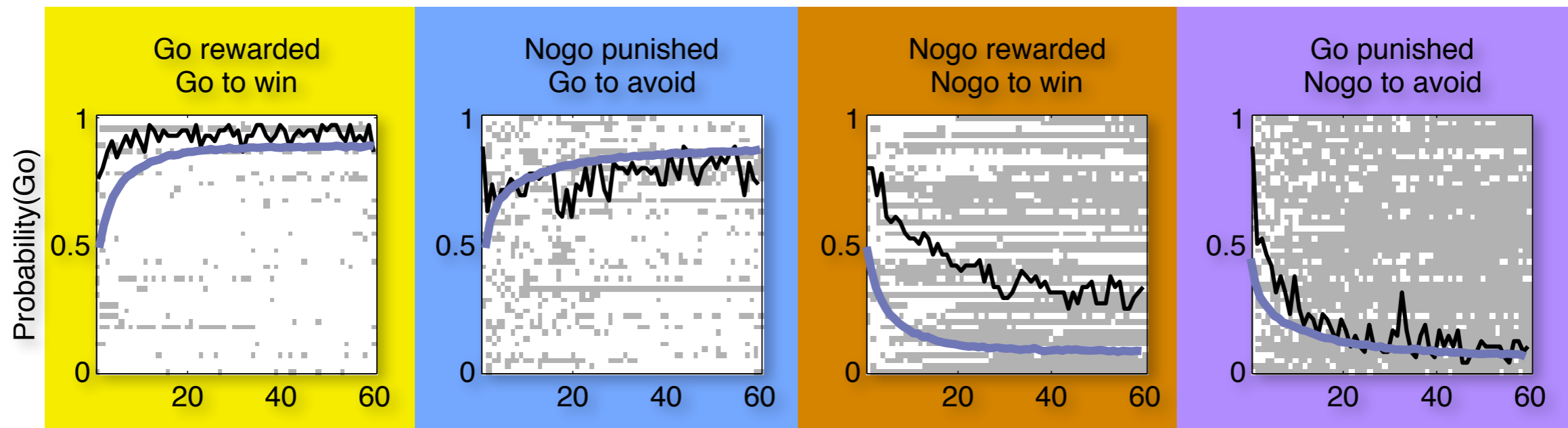


► Basic + bias

$$p_t(\text{go}|s) \propto Q_t(s, \text{go}) + \text{bias}(\text{go})$$

$$p_t(\text{nogo}|s) \propto Q_t(s, \text{nogo})$$

$$Q_{t+1}(s, a) = Q_t(s, a) + \alpha(r_t - Q_t(s, a))$$



Models

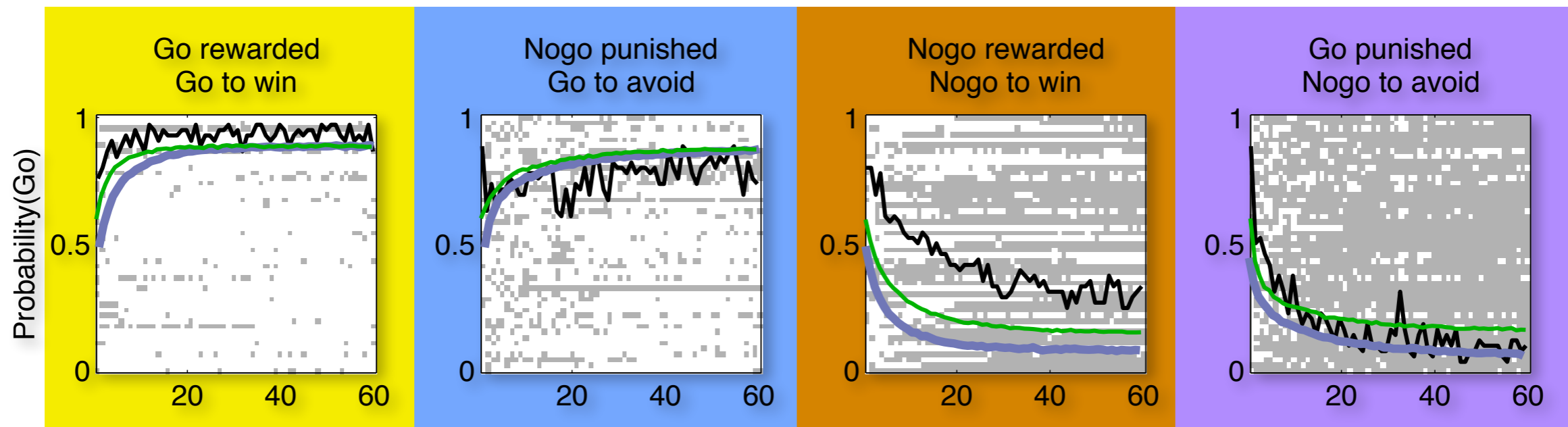


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Models



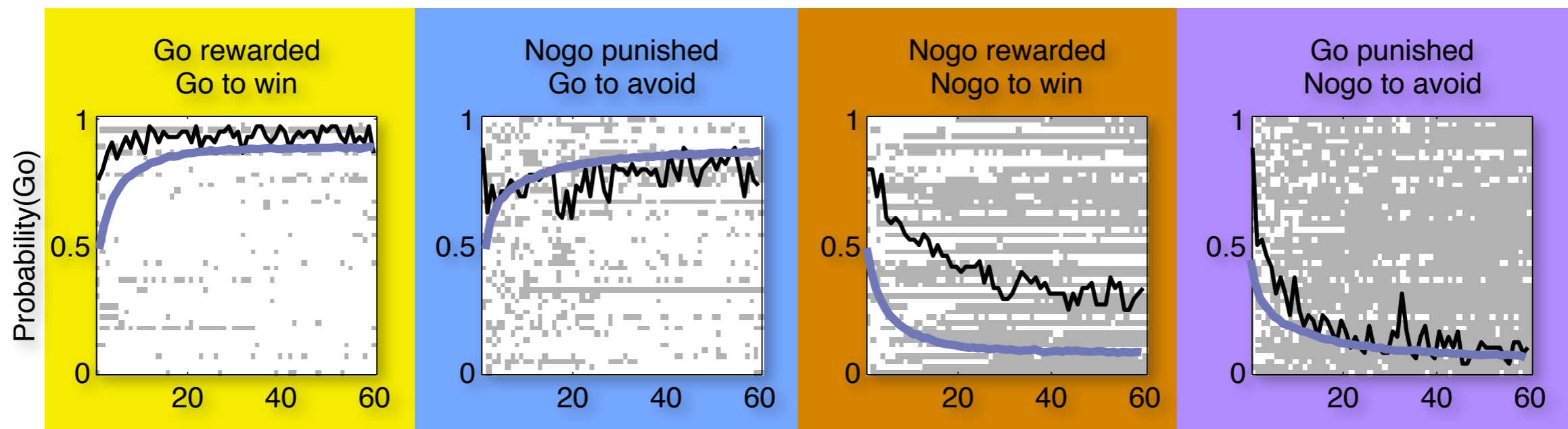
- ▶ Basic + bias + Pavlovian influence

$$p_t(\text{go}|s) \propto Q_t(s, \text{go}) + \text{bias}(\text{go}) + \pi V_t(s)$$

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$$Q_{t+1}(s, a) = Q_t(s, a) + \alpha(r_t - Q_t(s, a))$$

$$V_{t+1}(s) = V_t(s) + \alpha(r_t - V_t(s))$$



Models



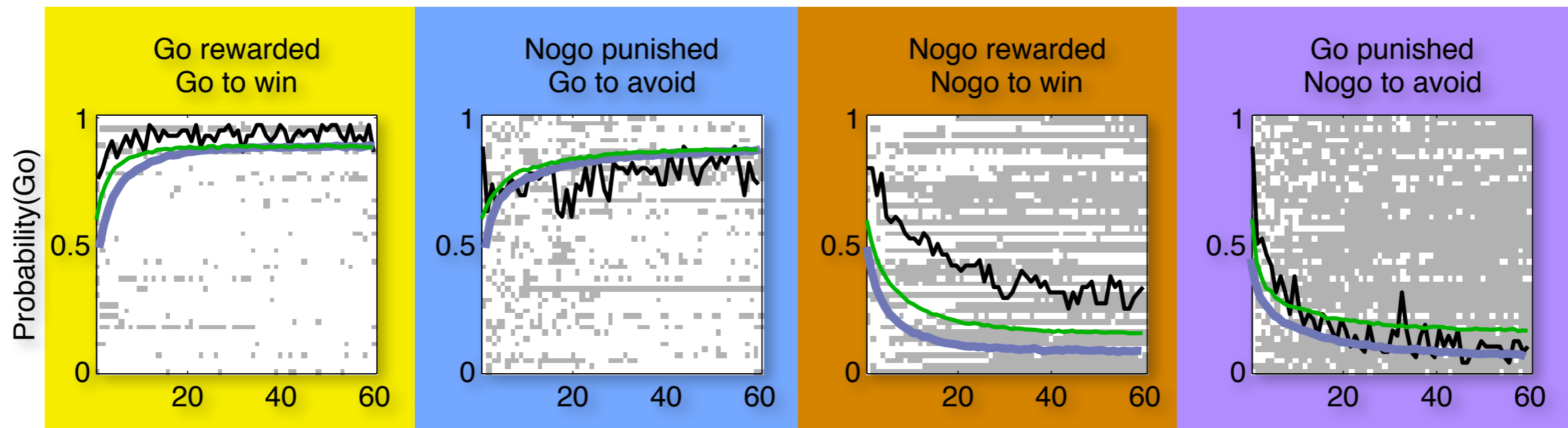
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Models



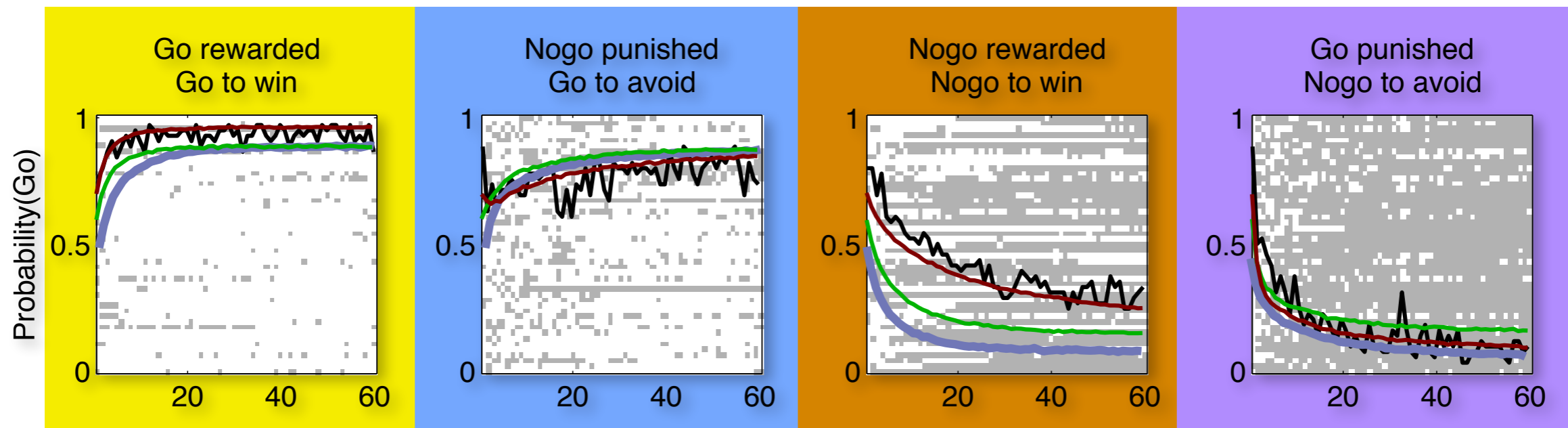
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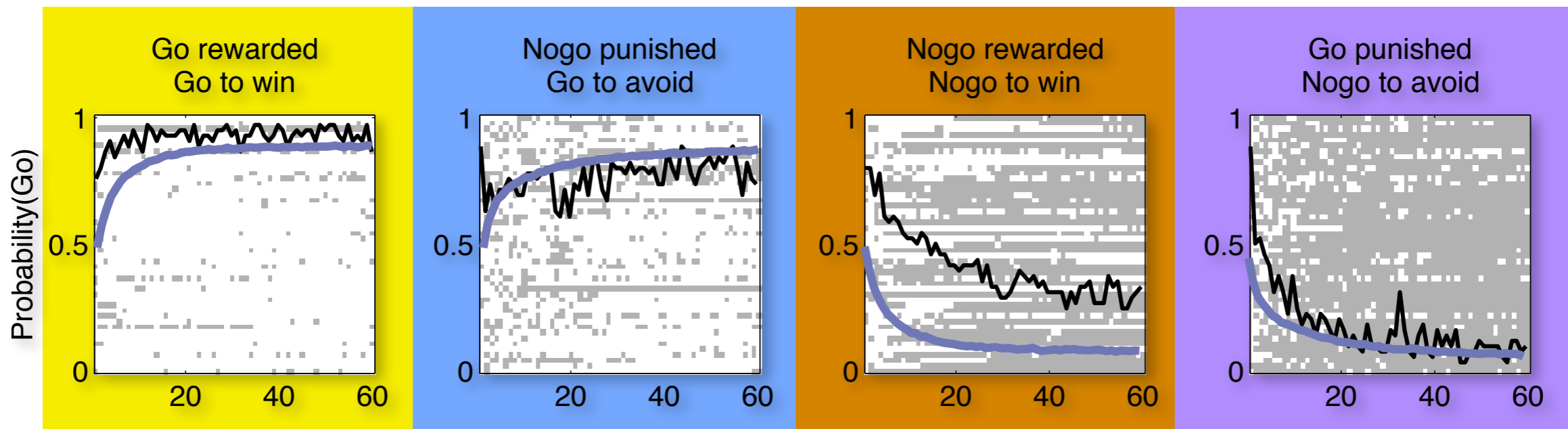
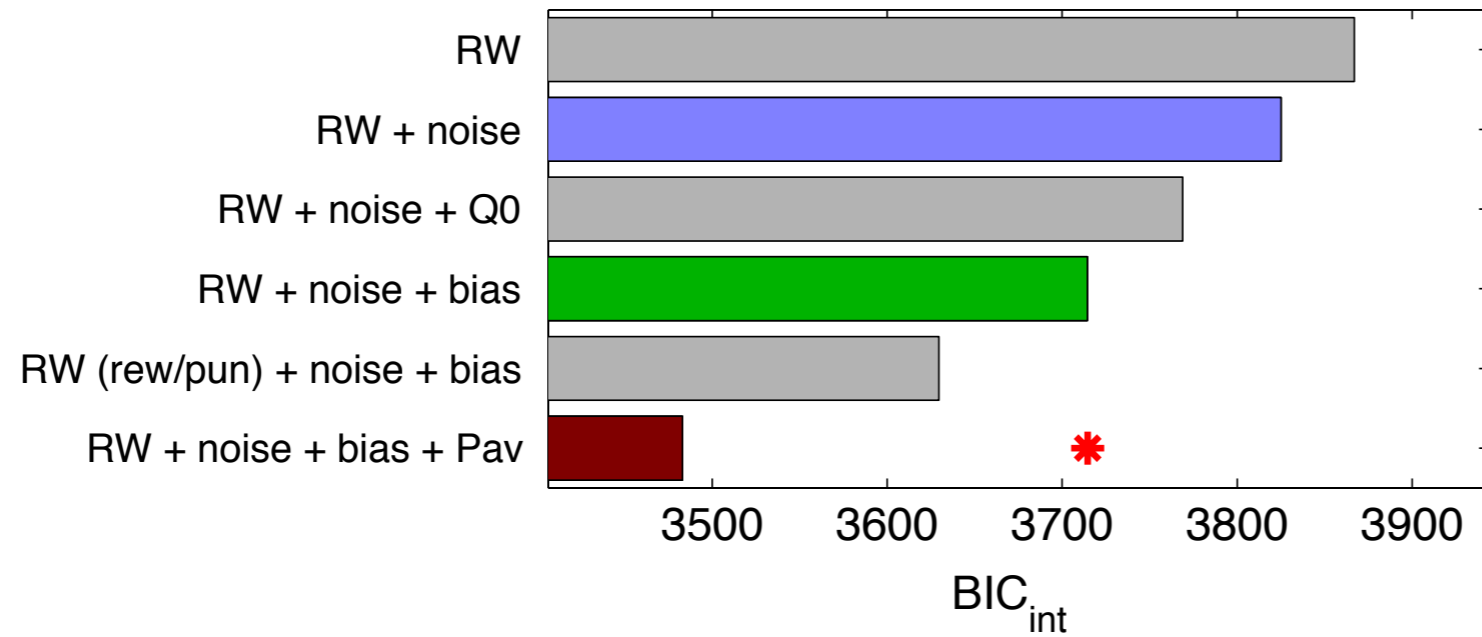
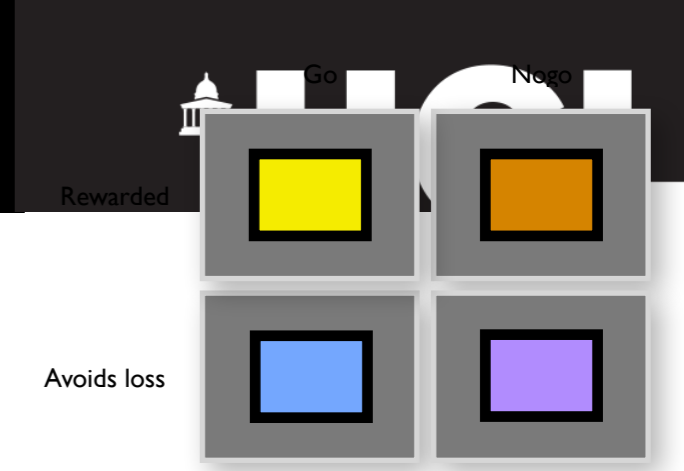
$$p_t(\text{nogo}|s) \propto Q_t(s, \text{nogo})$$

$$Q_{t+1}(s, a) = Q_t(s, a) + \alpha(r_t - Q_t(s, a))$$

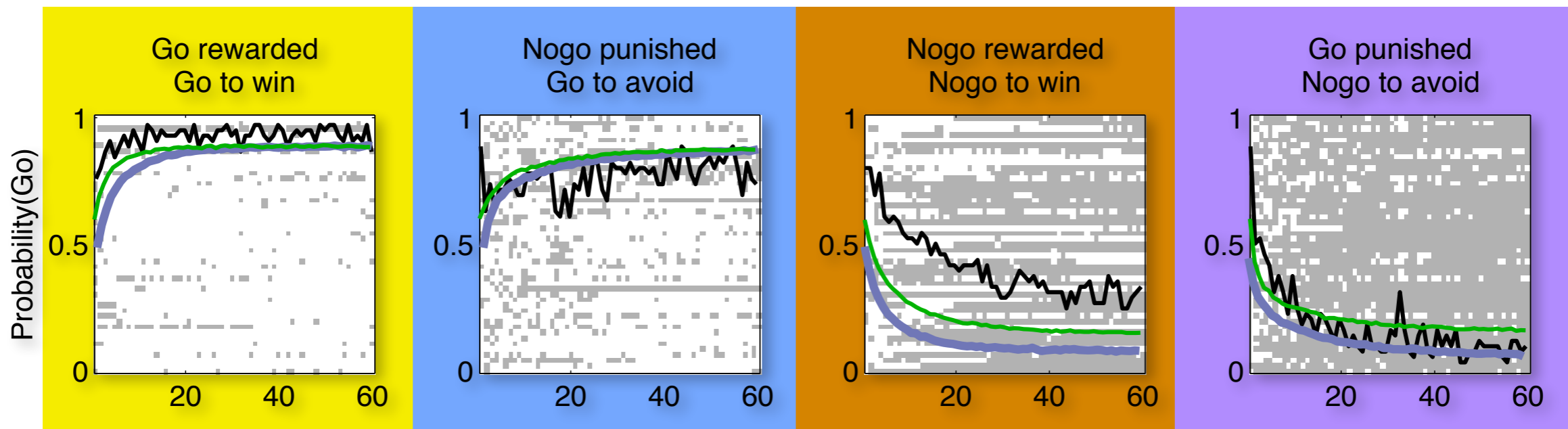
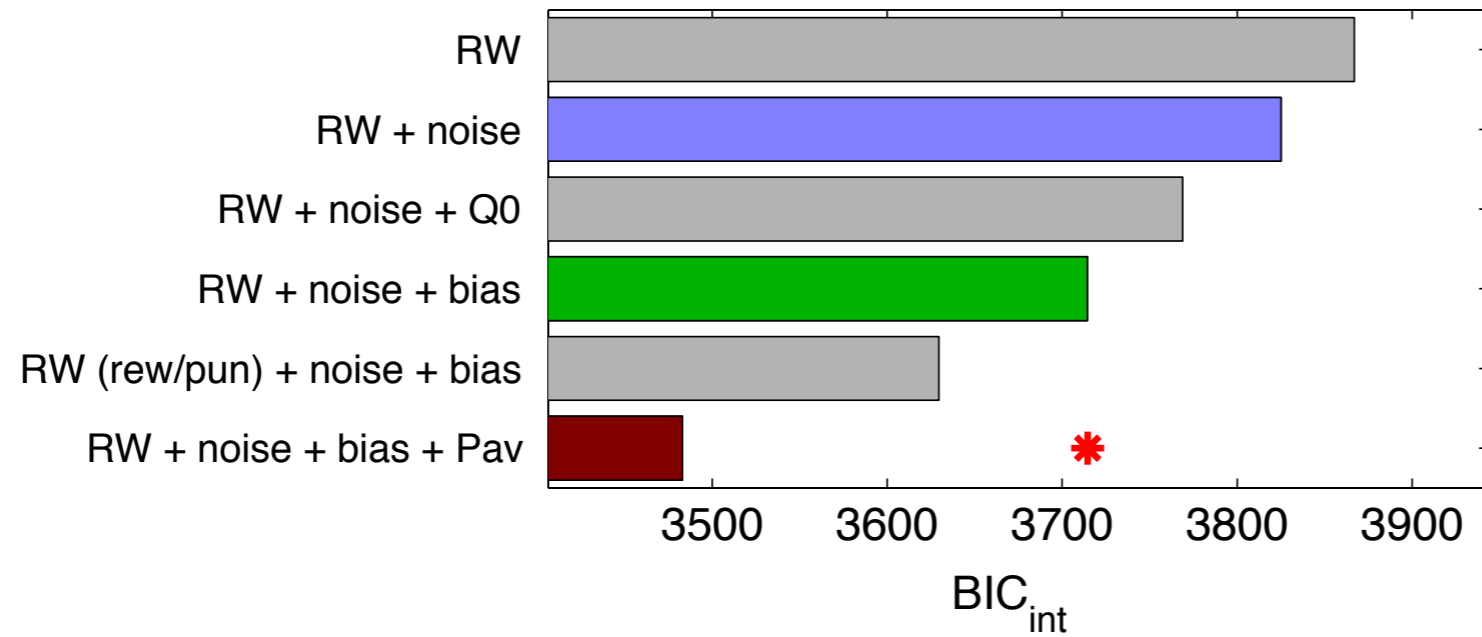
$$V_{t+1}(s) = V_t(s) + \alpha(r_t - V_t(s))$$



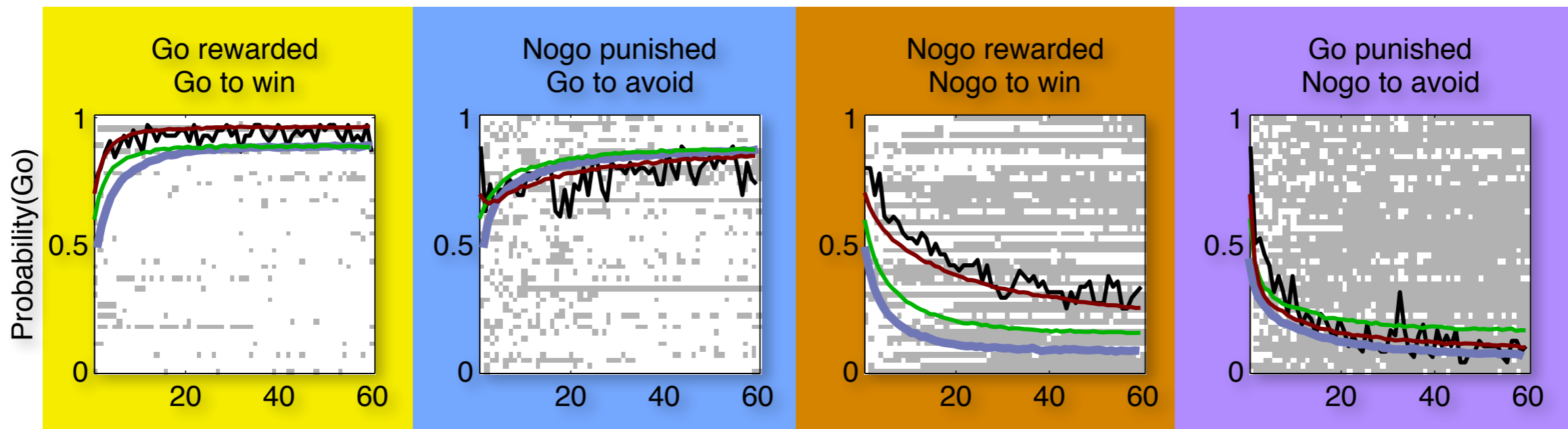
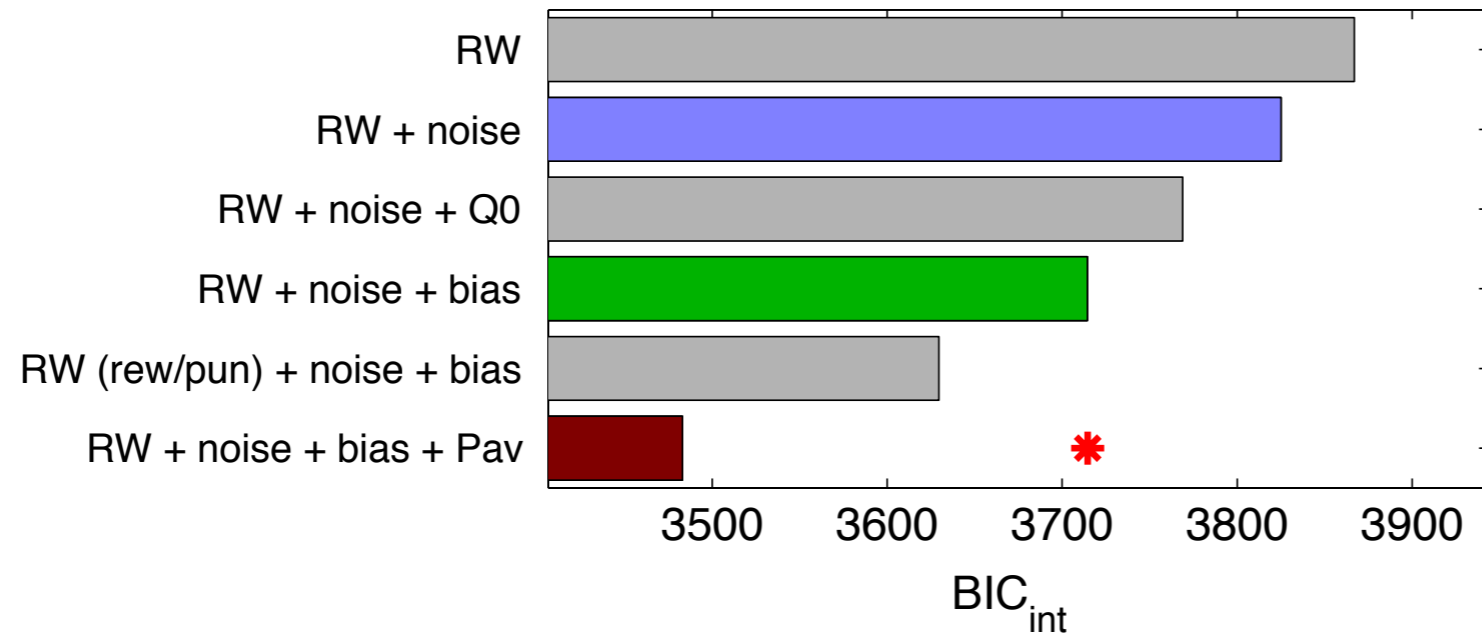
Model comparison: overfitting?



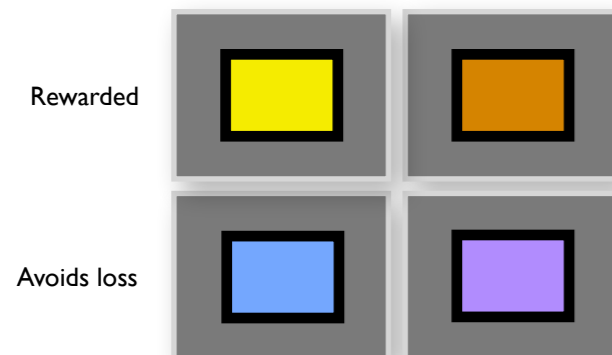
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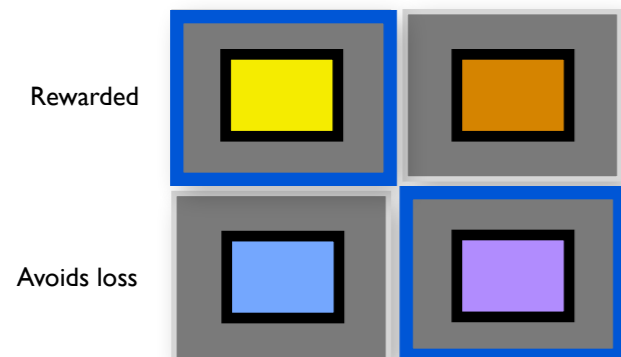
Model comparison: overfitting?



- ▶ Behavioural inhibition vs inhibitory control
- ▶ raphe vs vmPFC?
 - vmPFC activation when pruning is overridden.
 - Inhibitory control of behavioural inhibition?
 - Warden et al. 2012 Nature

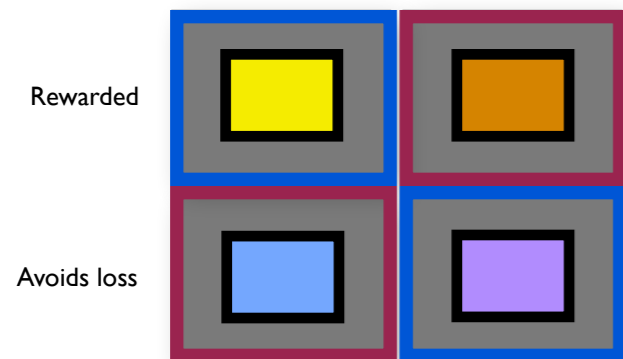


- ▶ Behavioural inhibition vs inhibitory control
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congruent

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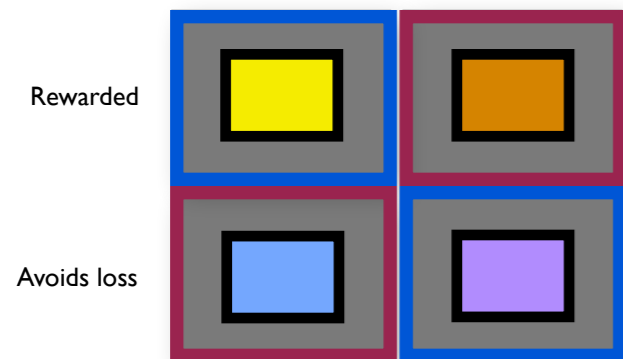


congruent

-

incongruent

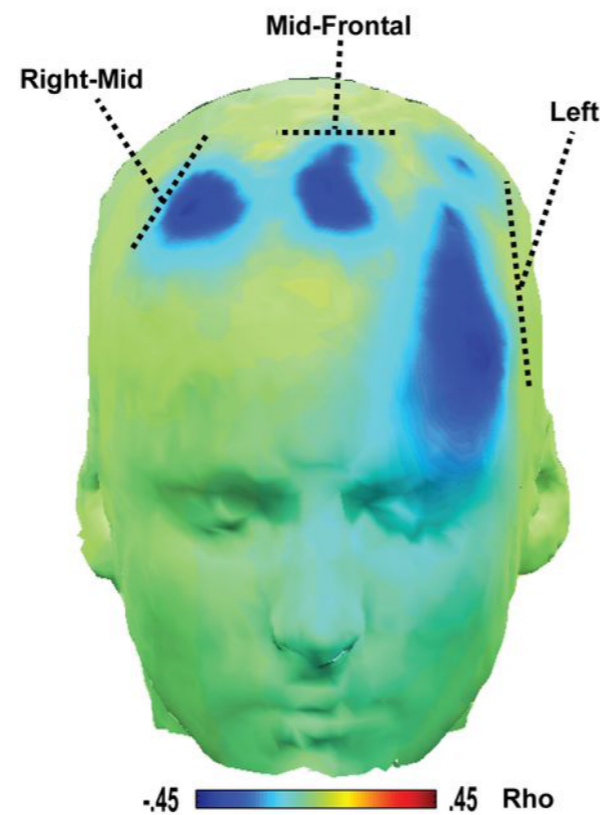
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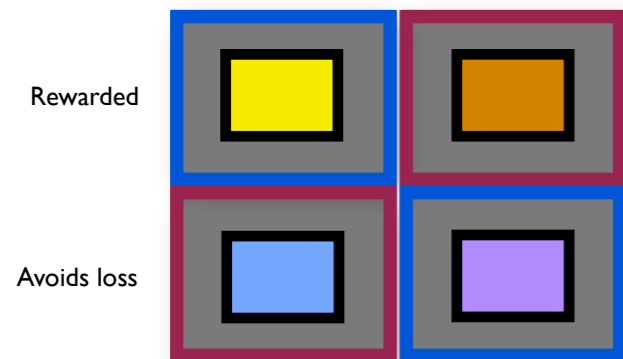
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incongruent



Cavanagh et al. subm.

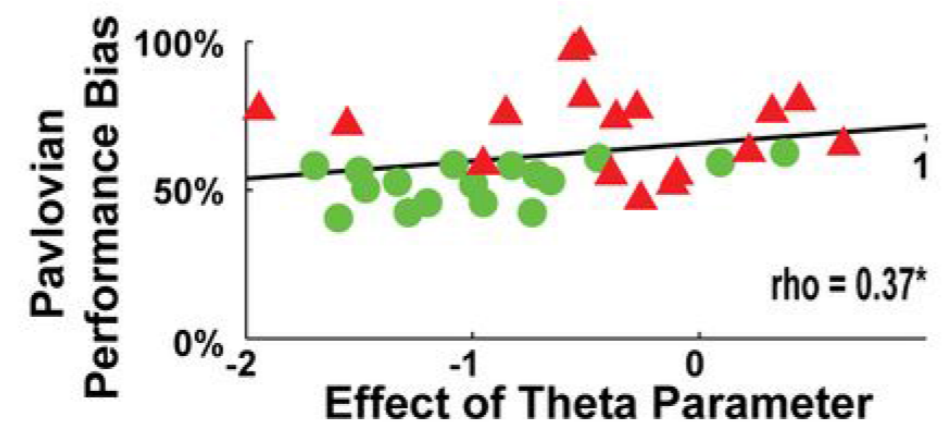
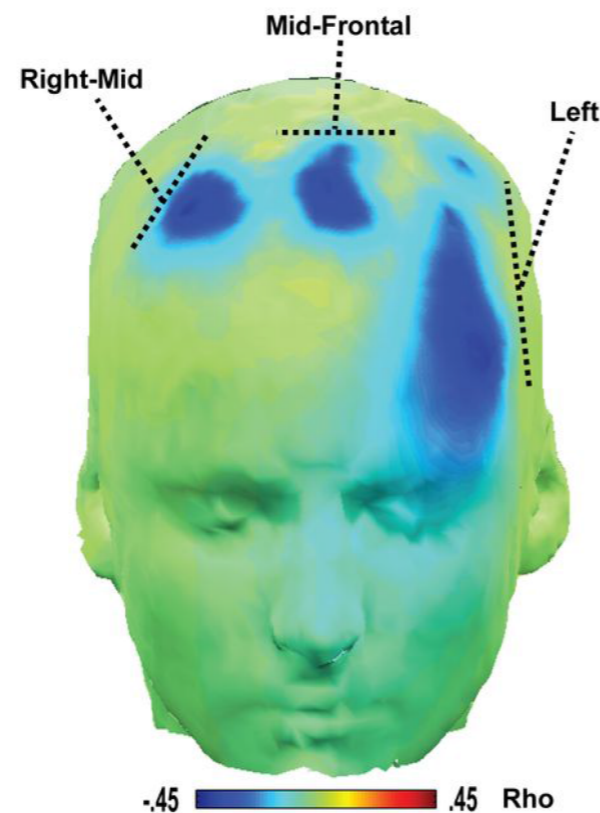
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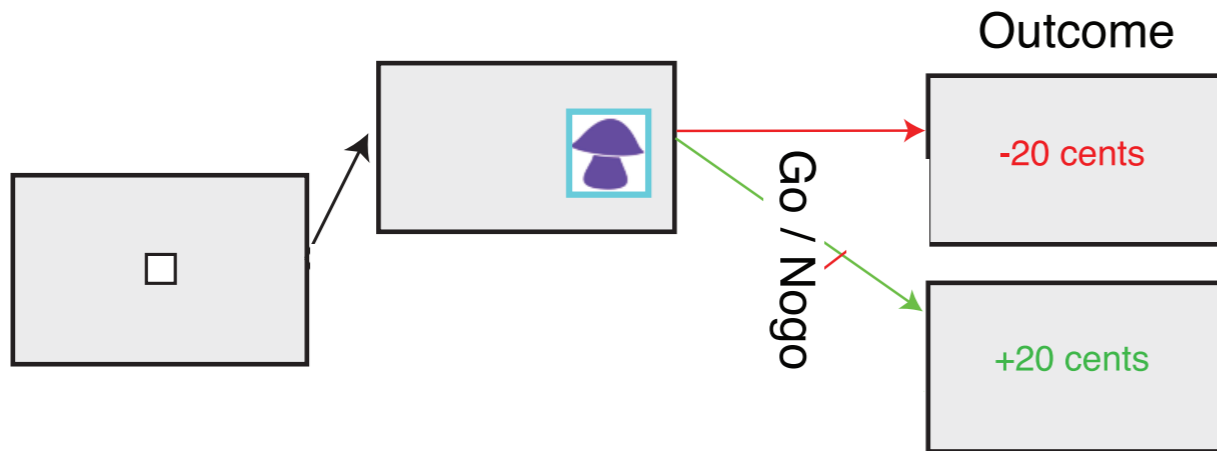
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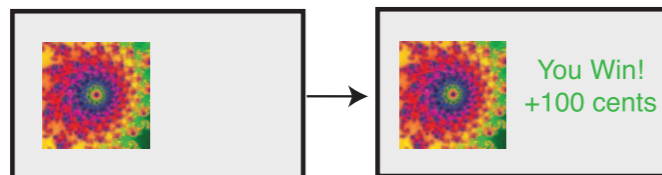
A: Instrumental training Mushrooms as instrumental stimuli



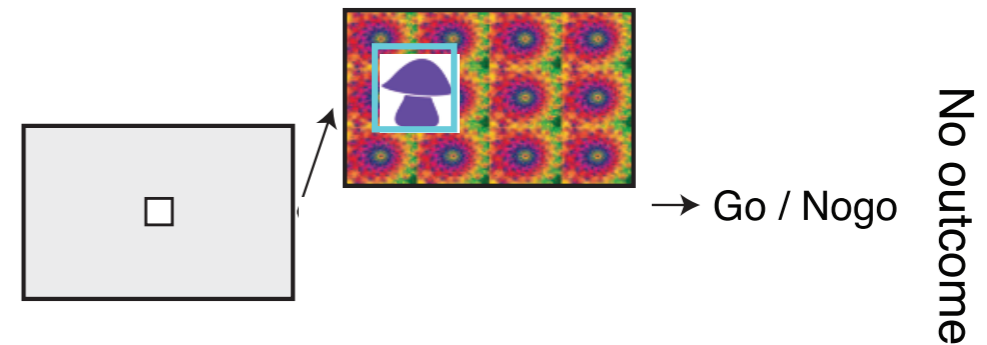
Click in the central square to start trial

Move cursor & click in blue square (go) or do nothing (nogo)

B: Pavlovian training Fractals and tones as Pavlovian stimuli



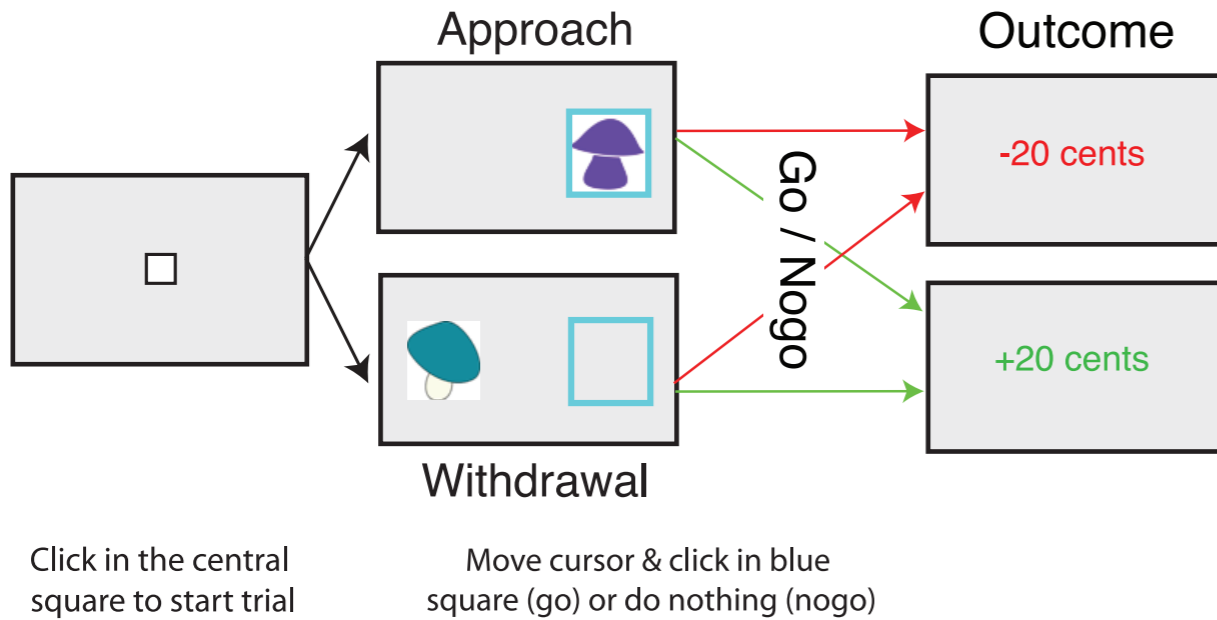
D: Pavlovian-instrumental transfer Instrumental mushroom stimuli on background of Pavlovian fractal stimuli



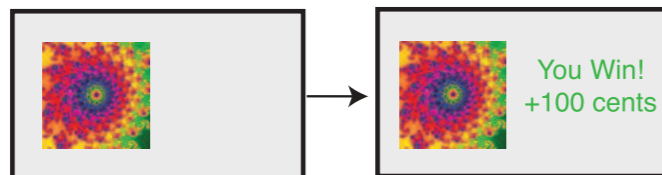
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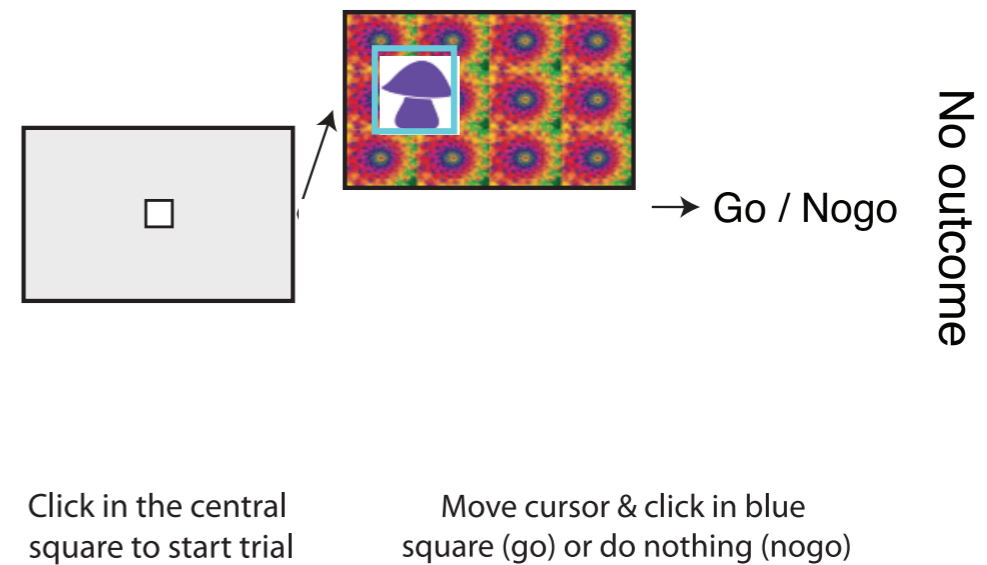
A: Instrumental training Mushrooms as instrumental stimuli



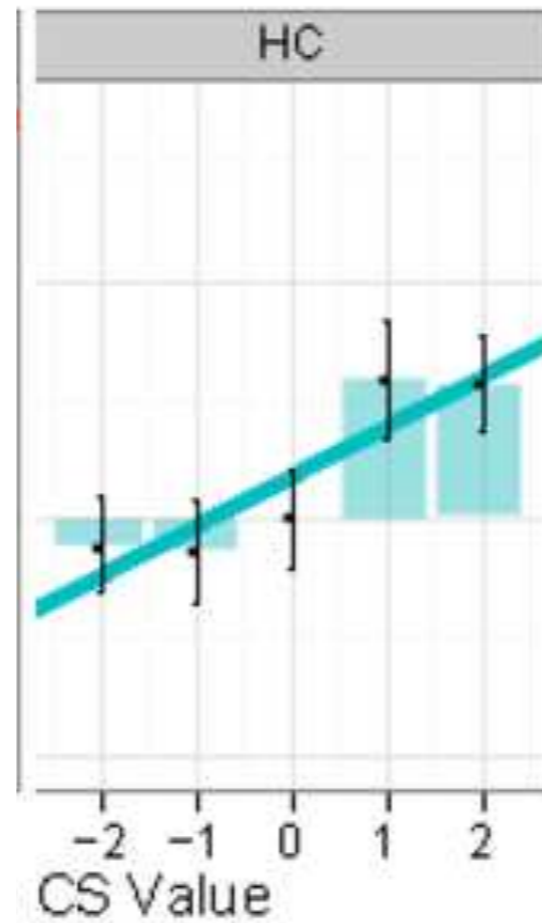
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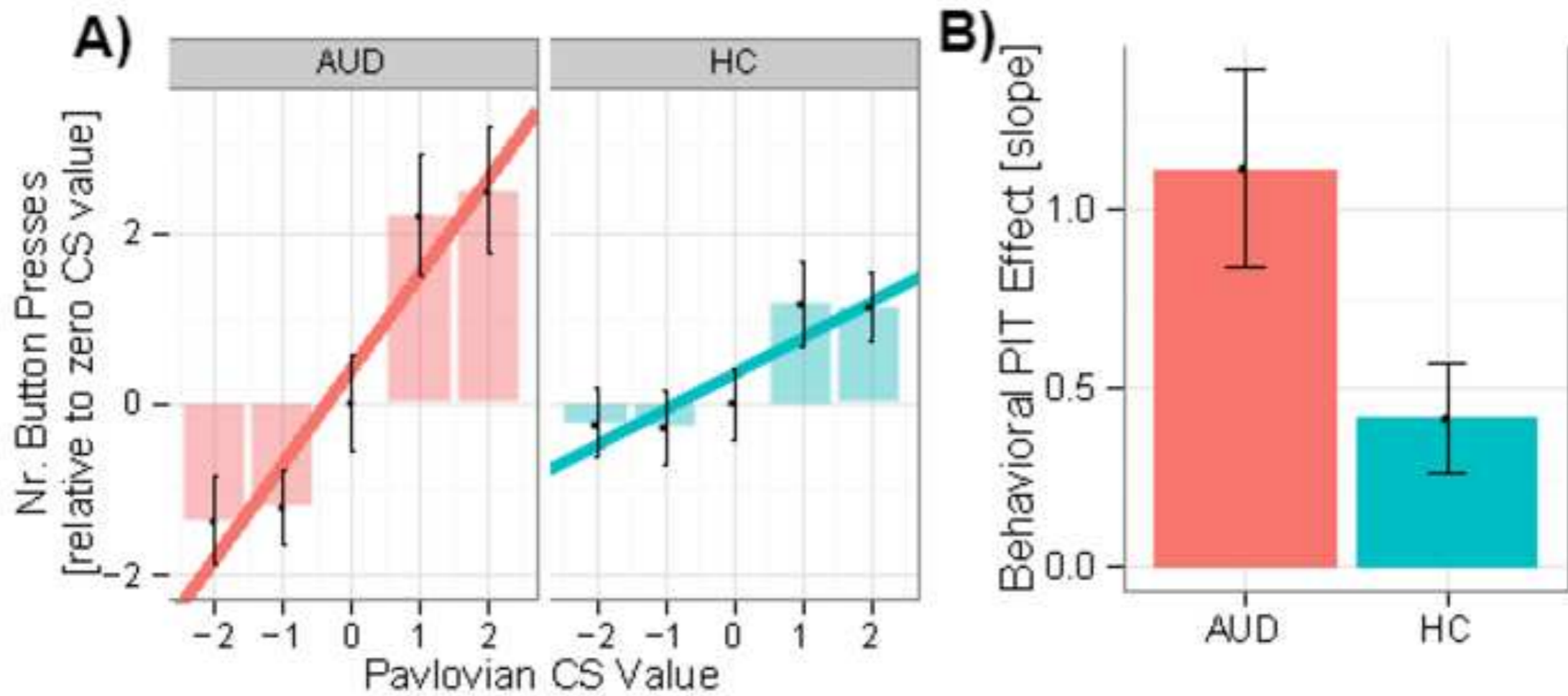
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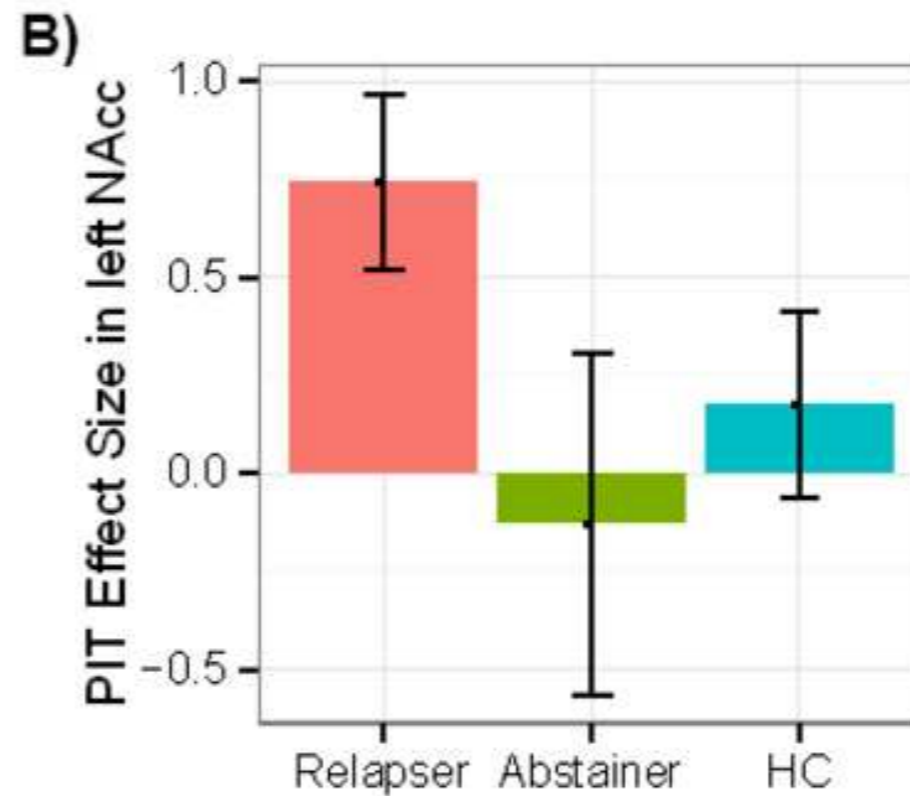
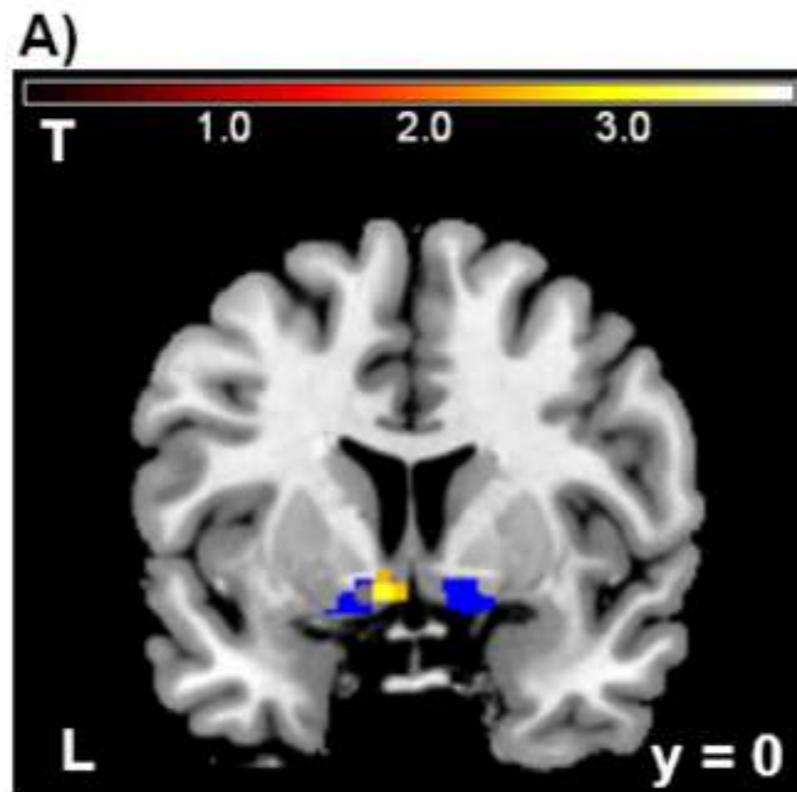
At group level PIT is stronger in patients



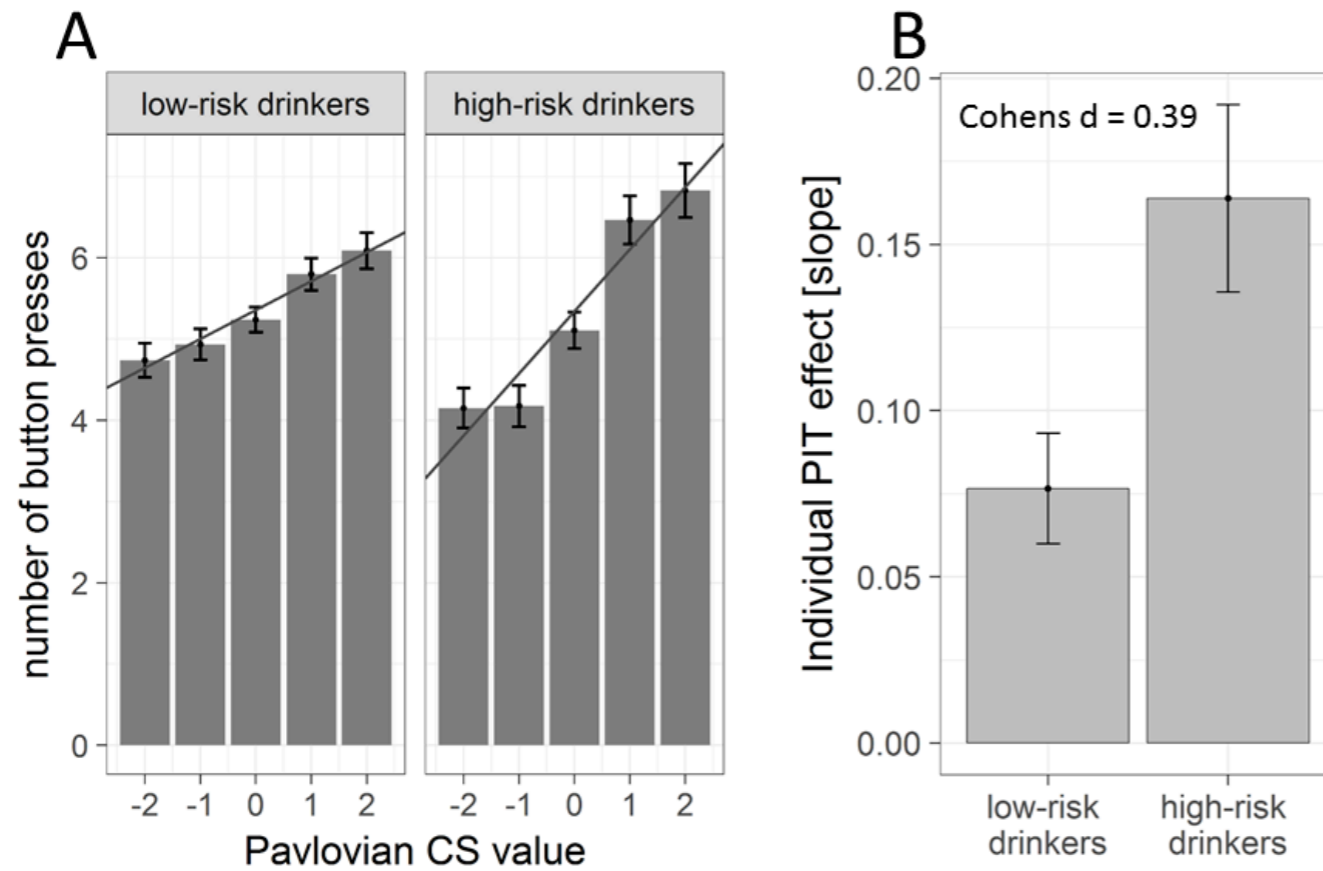
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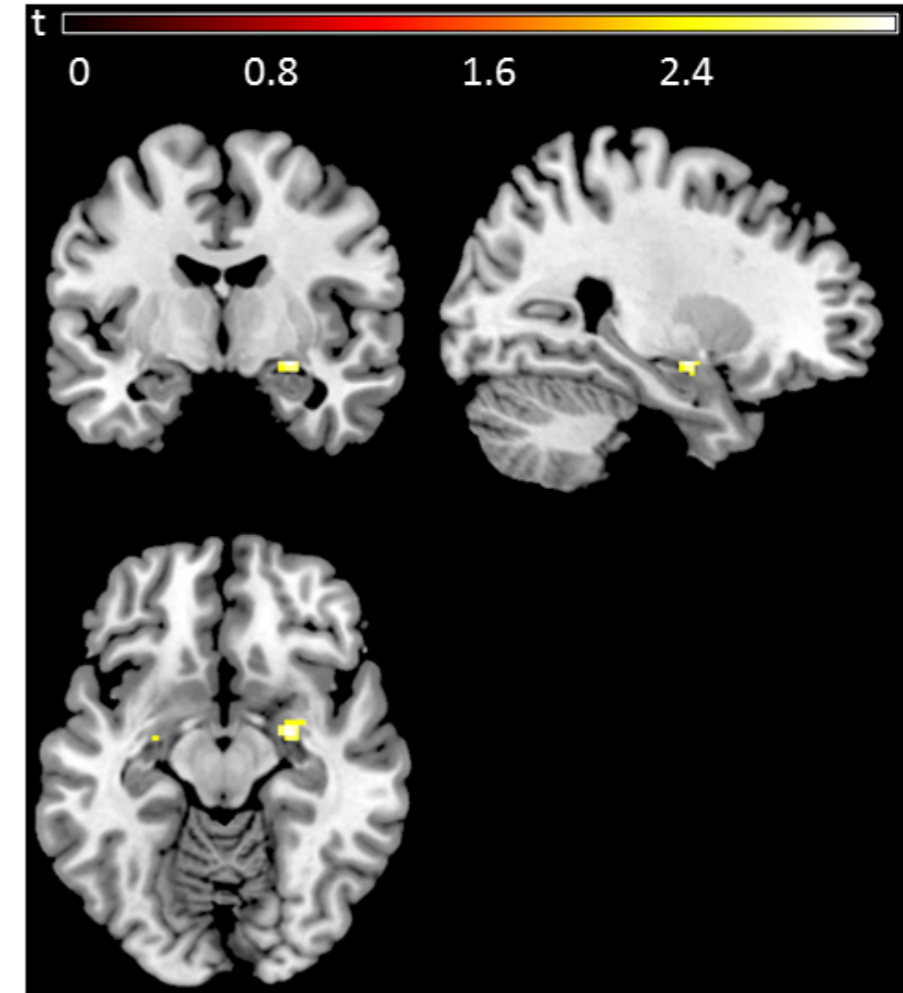
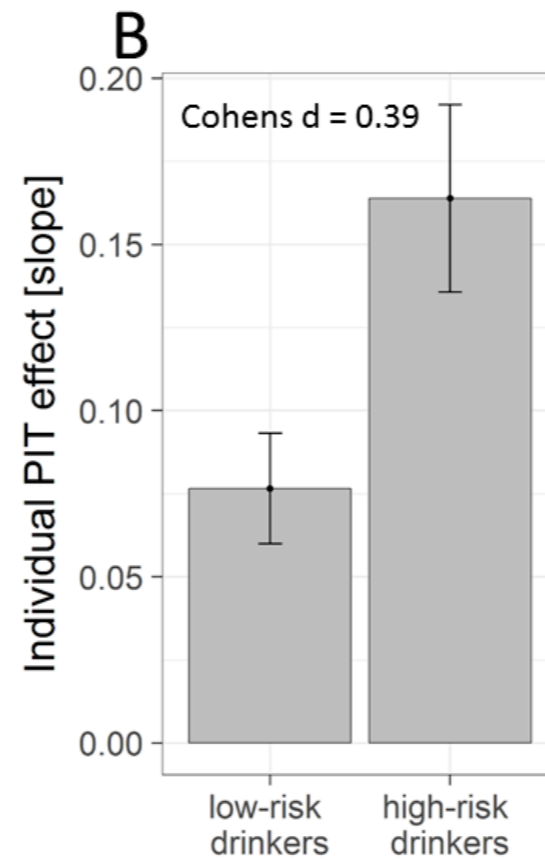
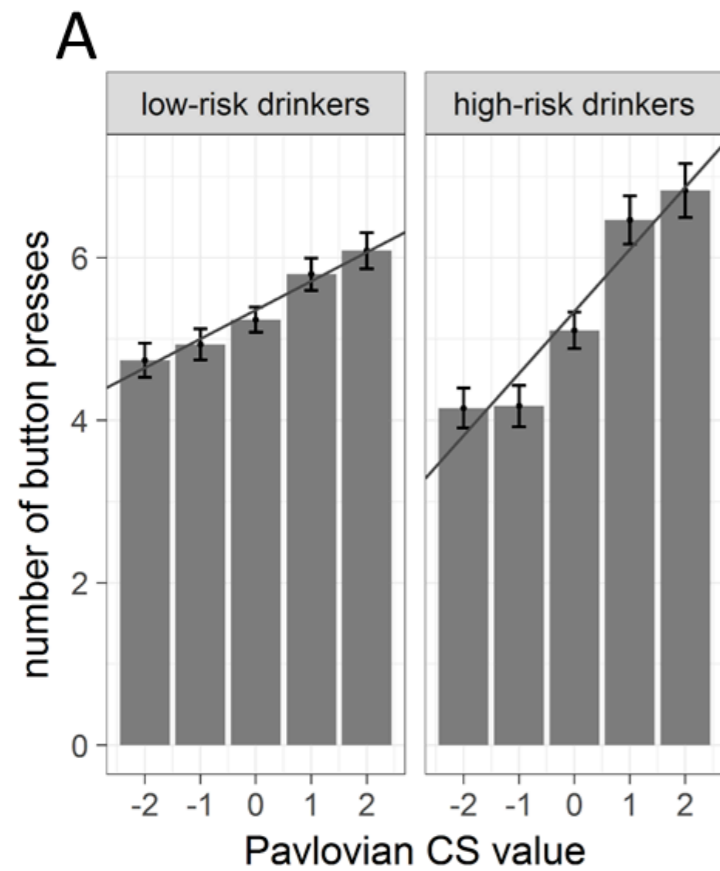
NAcc PIT in relapsers only

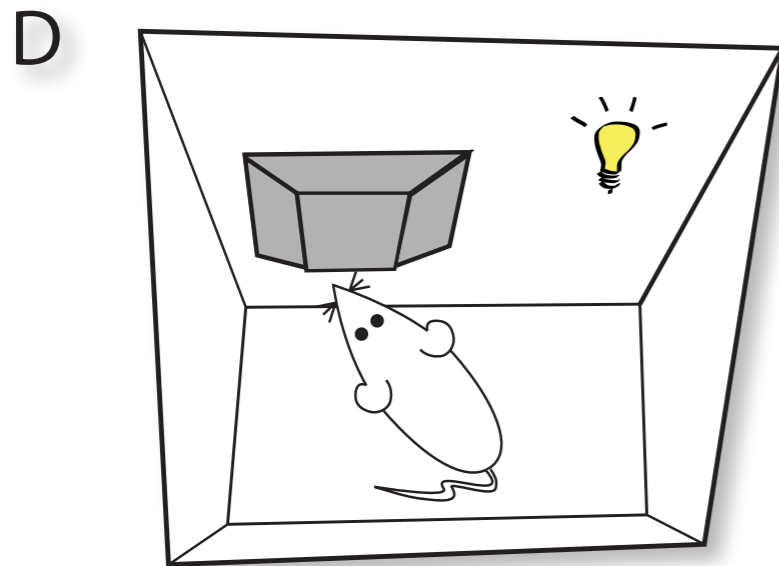
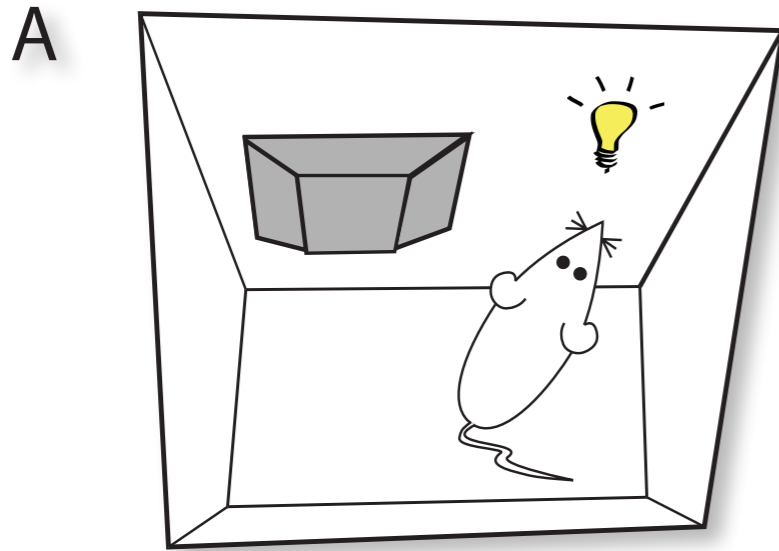


PIT in at-risk young males



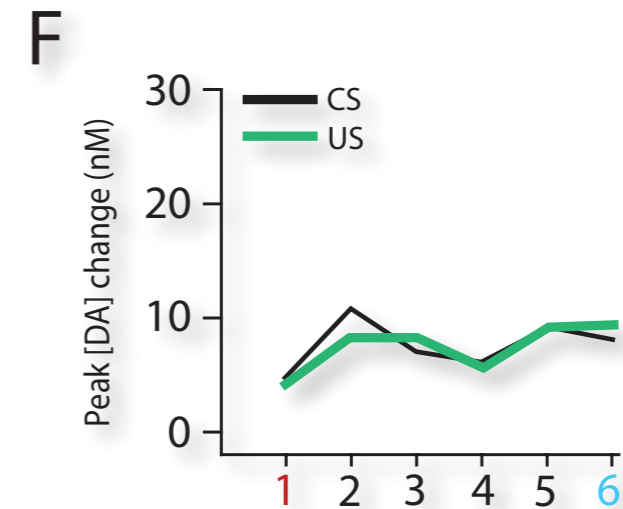
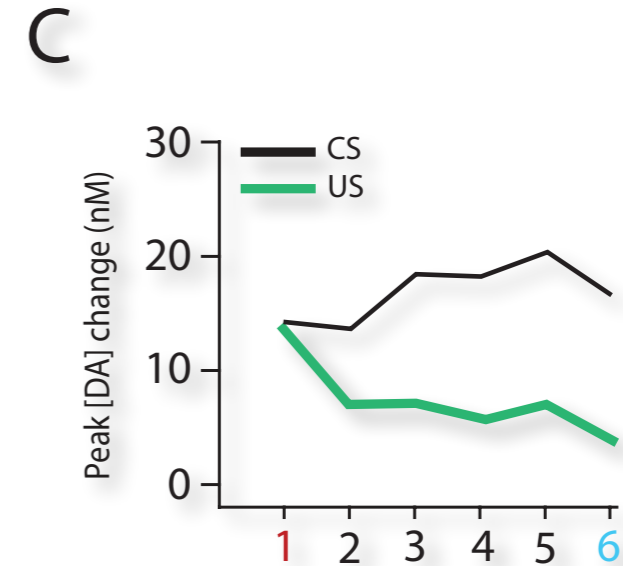
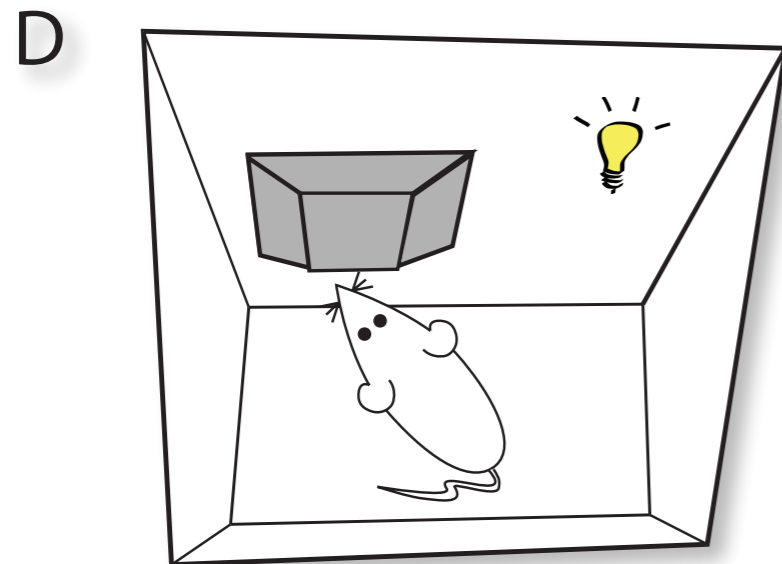
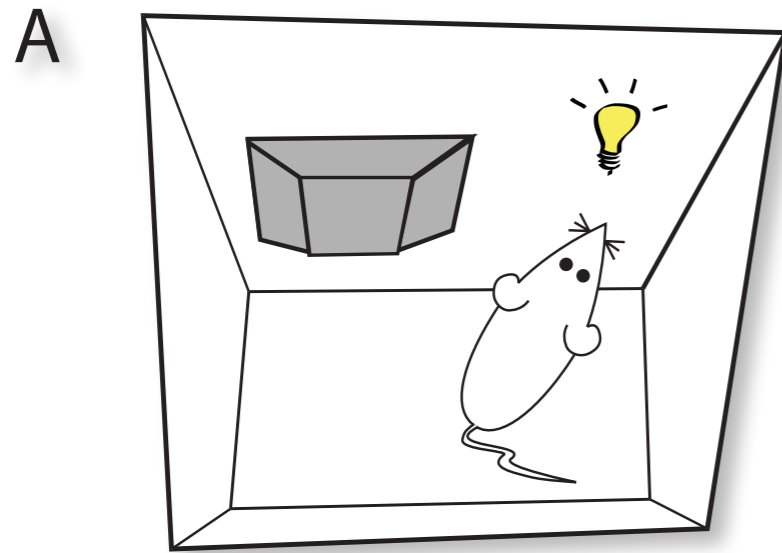
PIT in at-risk young males





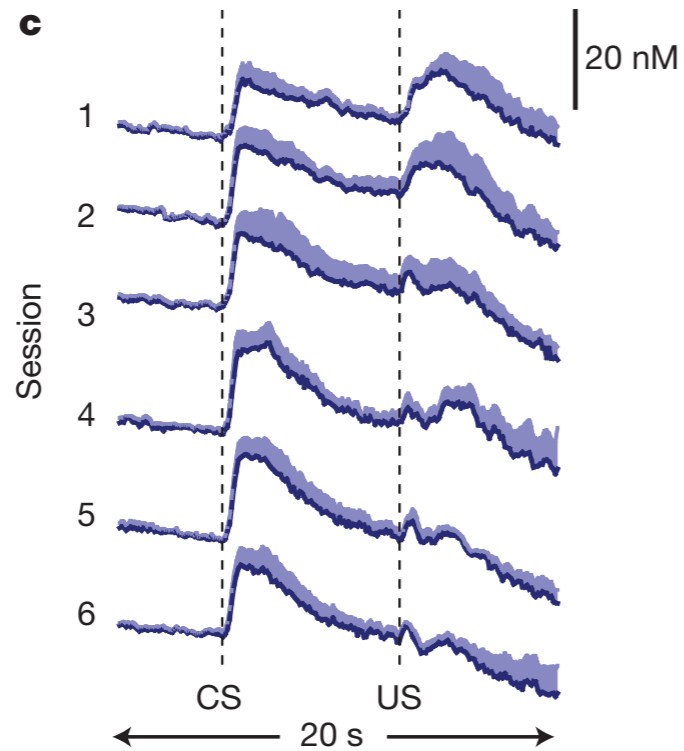
Flagel et al., 2011 Nature, Huys et al., 2014 Prog. Neurobiol.

Addictive Pavlovian values

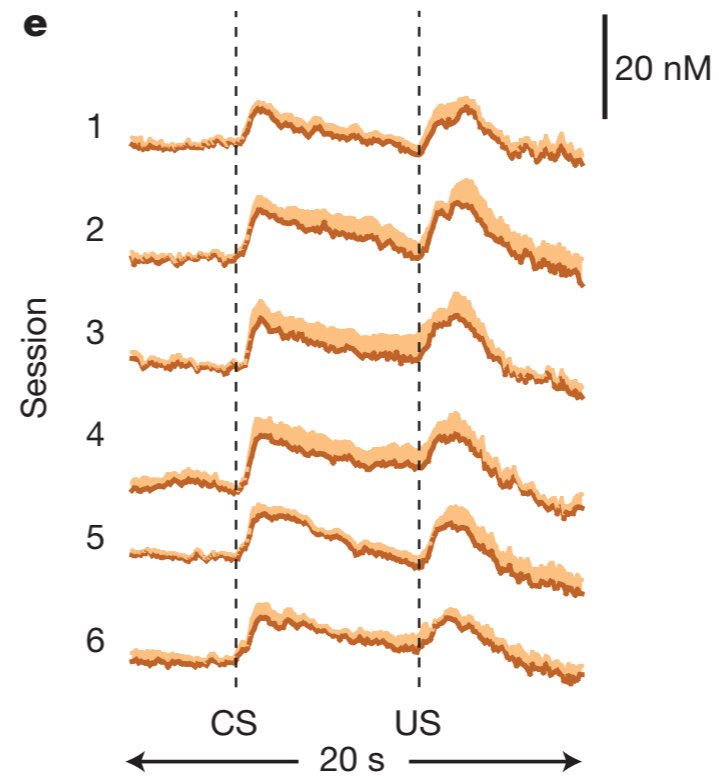


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Sign trackers

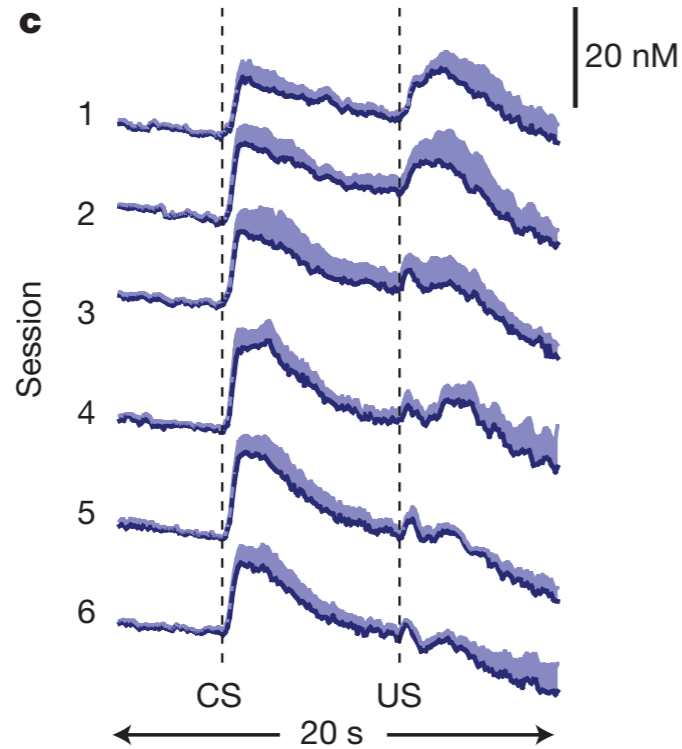


Goal trackers

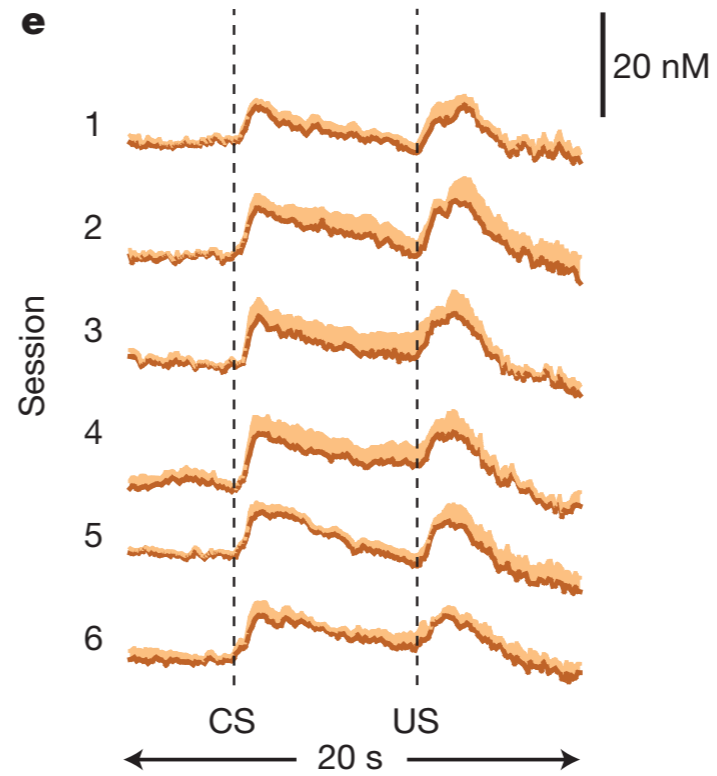


$$\delta = r - Q$$

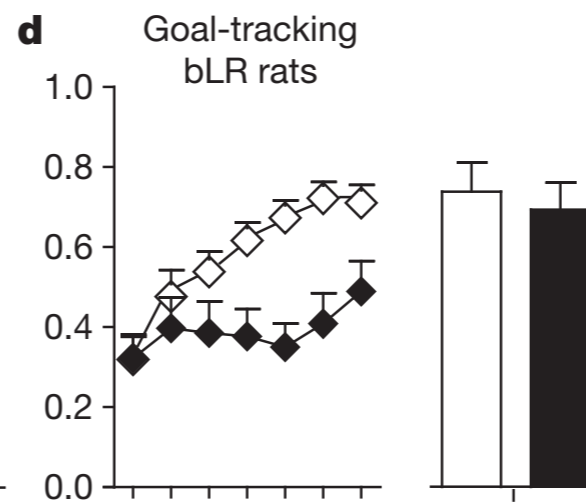
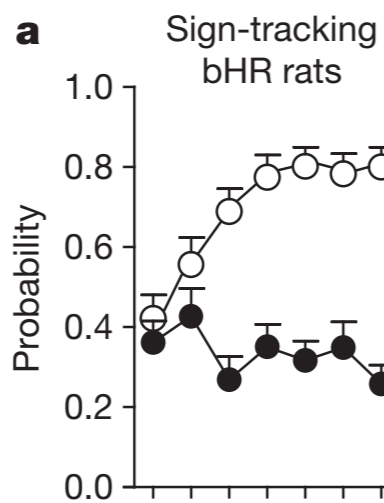
Sign trackers



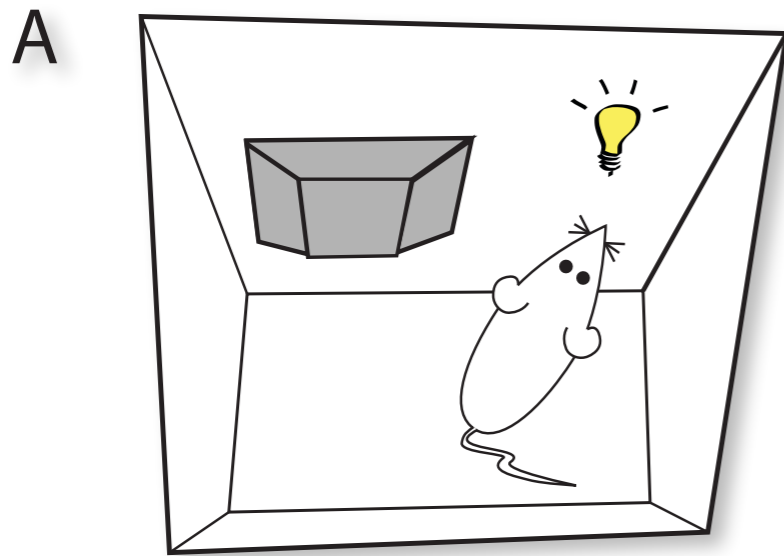
Goal trackers



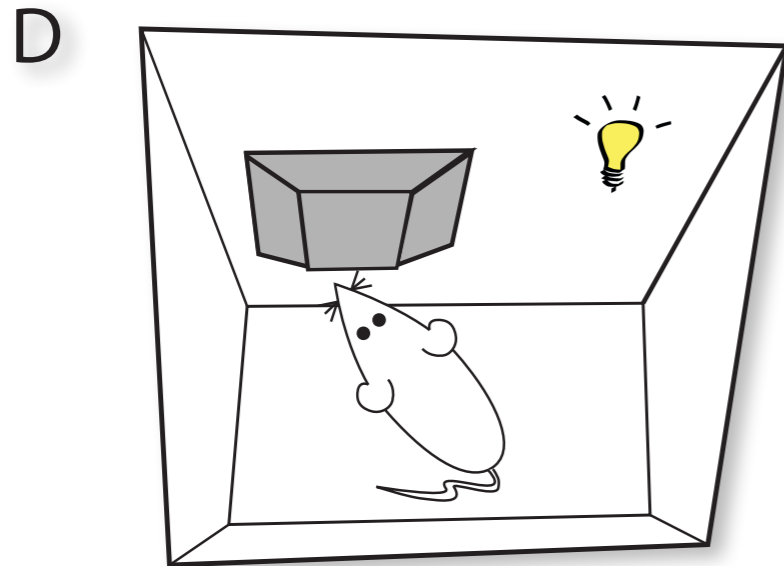
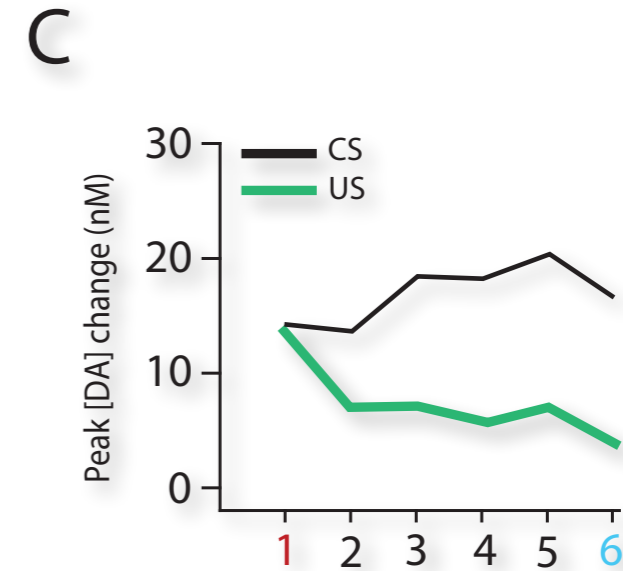
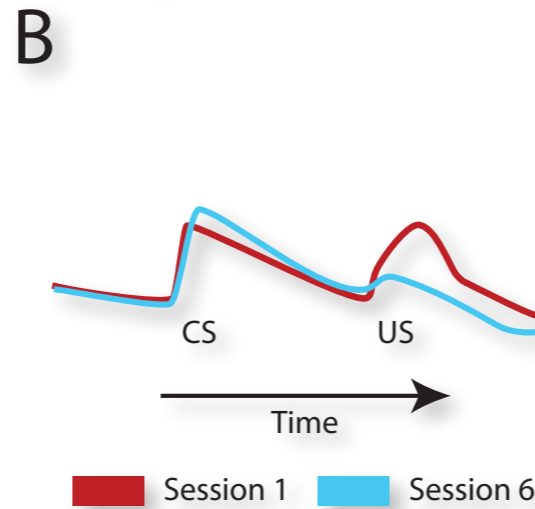
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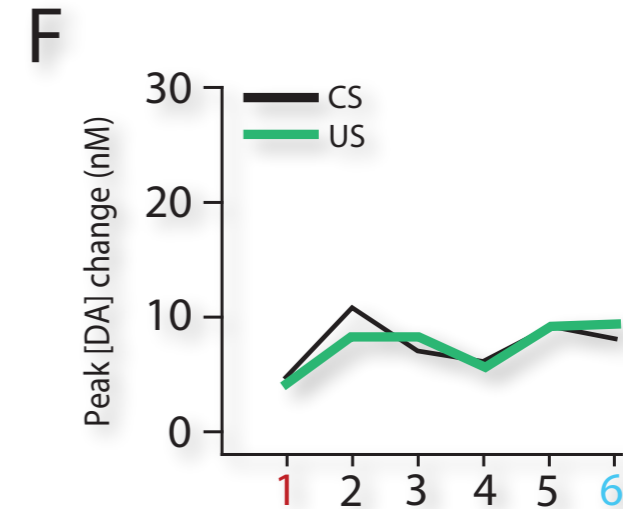
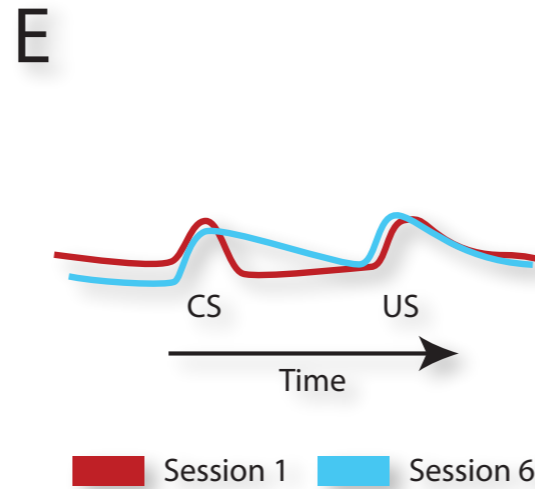
Pavlovian state values: sign tracking



Sign trackers



Goal trackers

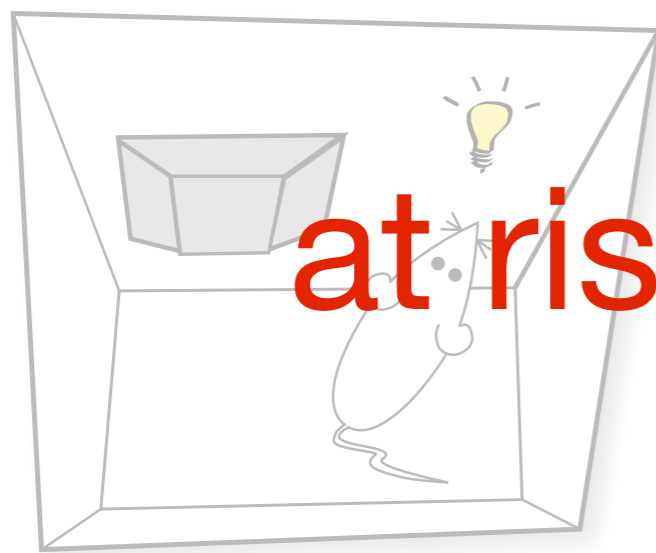


Flagel et al., 2011 Nature

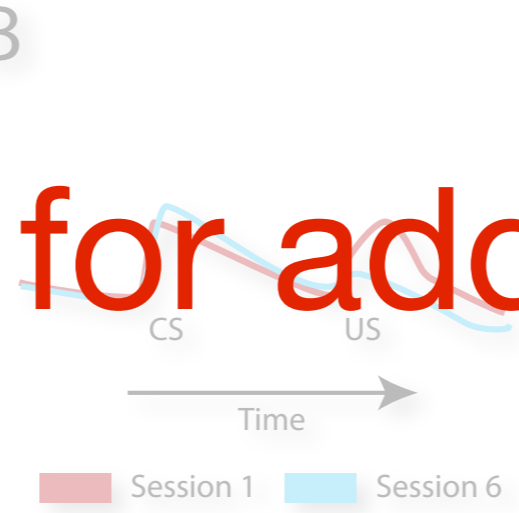
at risk for addiction

Sign trackers

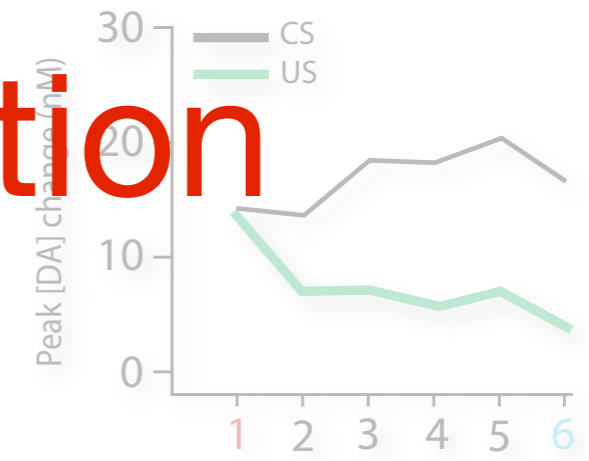
A



B

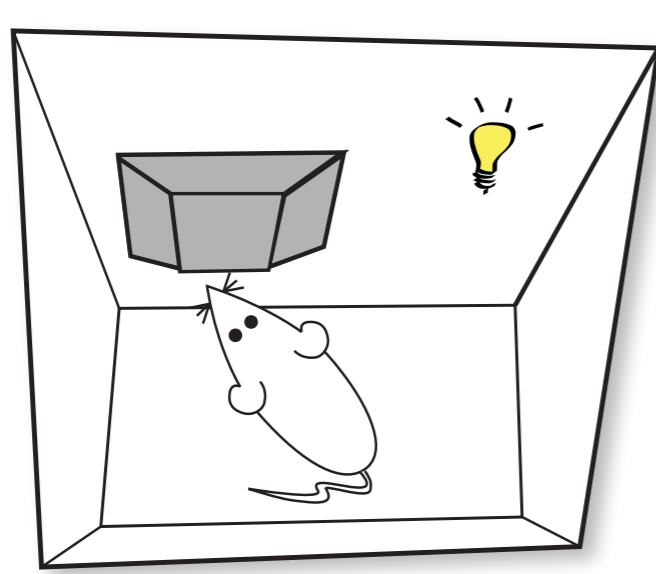


C

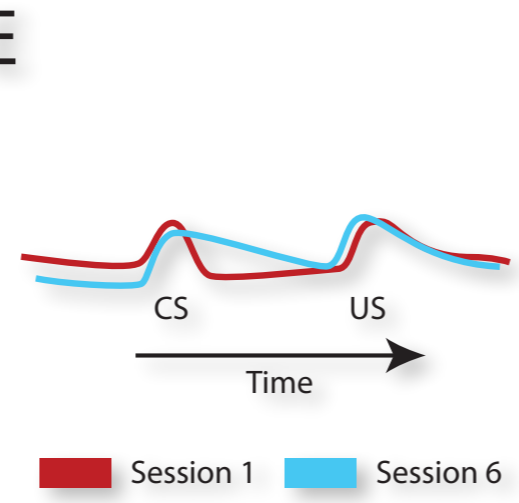


Goal trackers

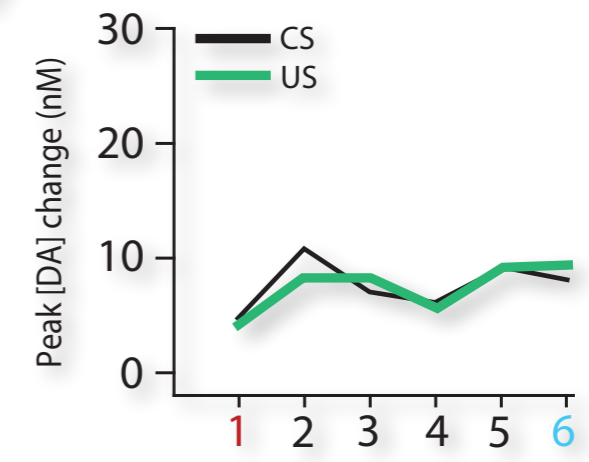
D



E



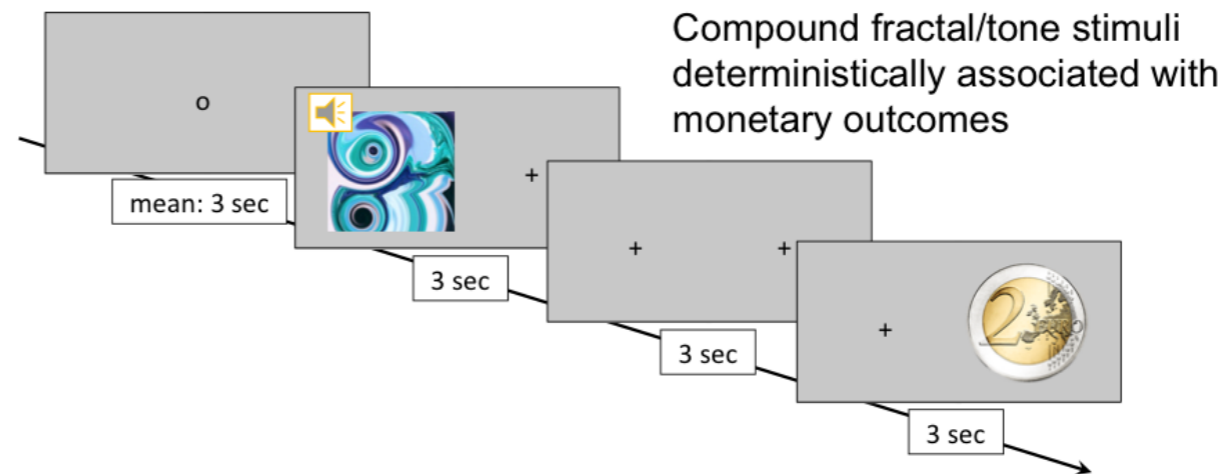
F



Sign-tracking in humans?

Experimental Paradigm
Pavlovian Conditioning

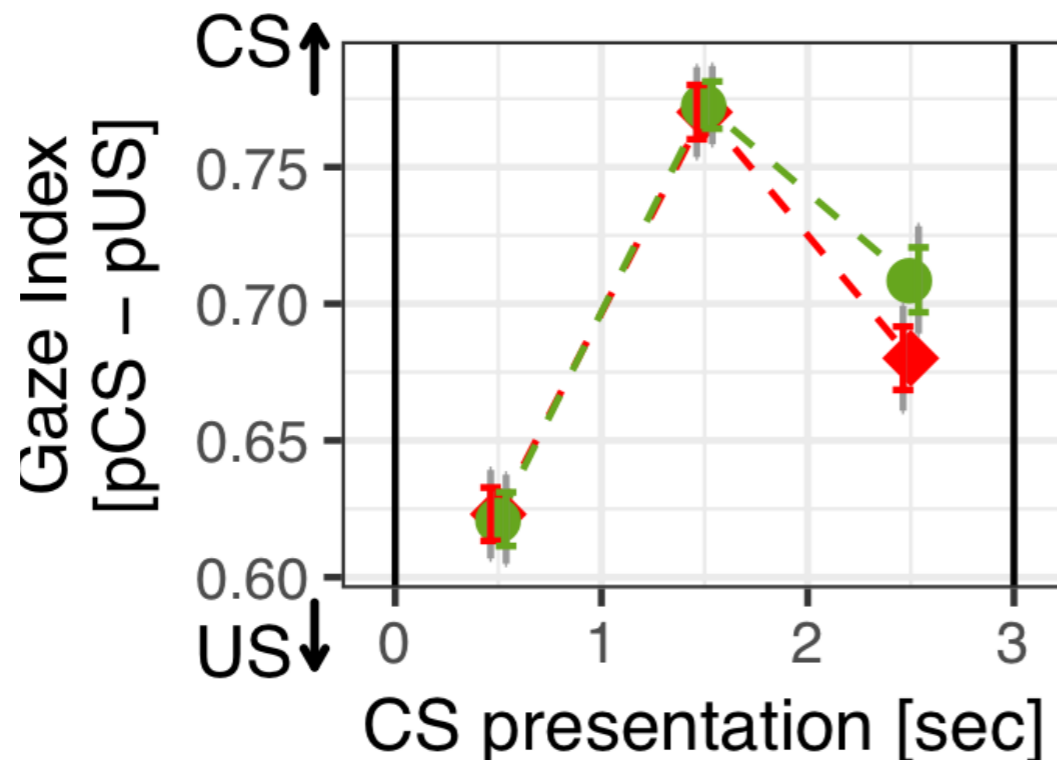
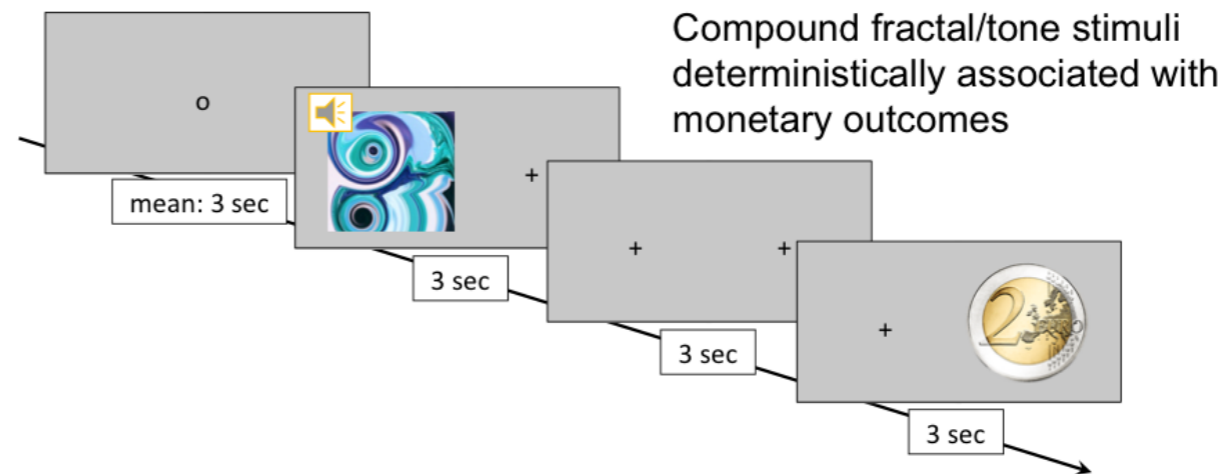
n=129



Sign-tracking in humans?

Experimental Paradigm
Pavlovian Conditioning

n=129

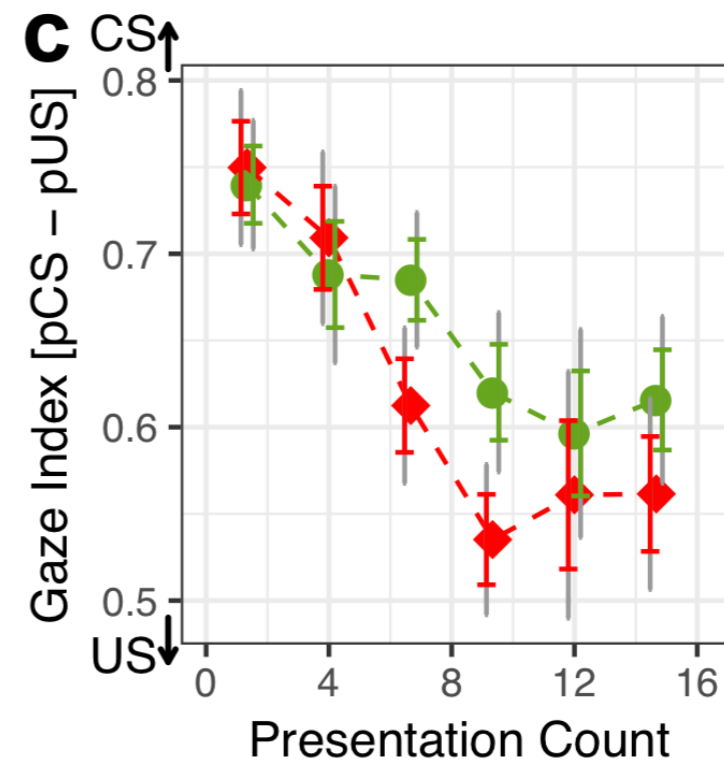
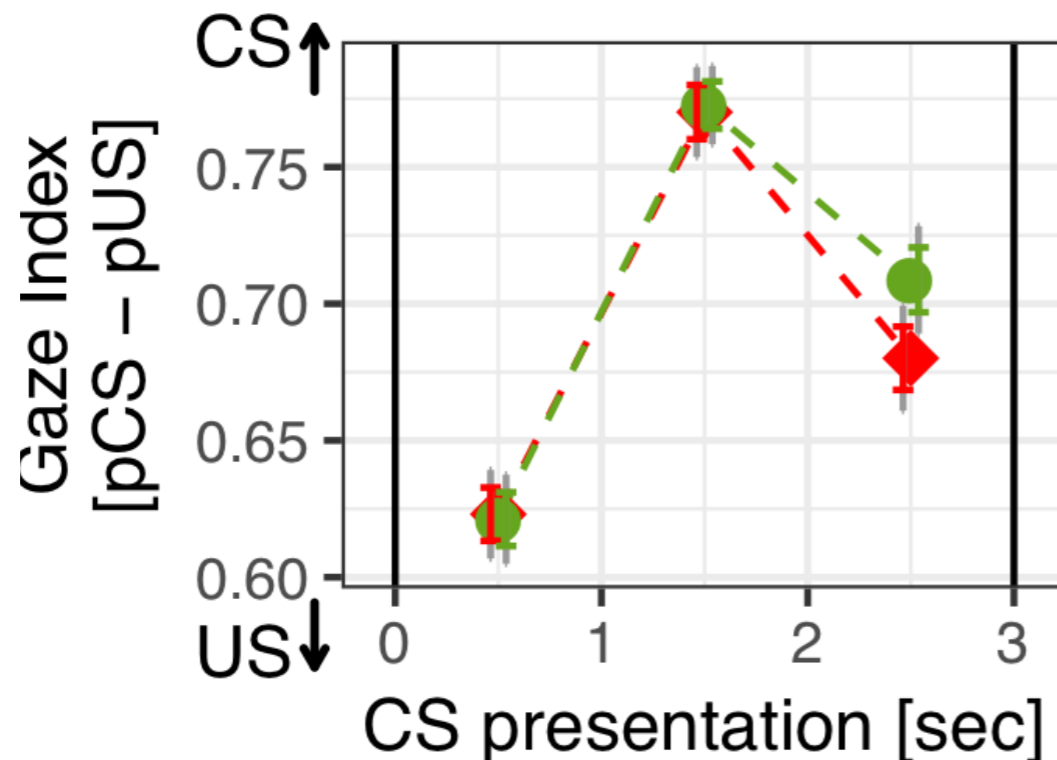
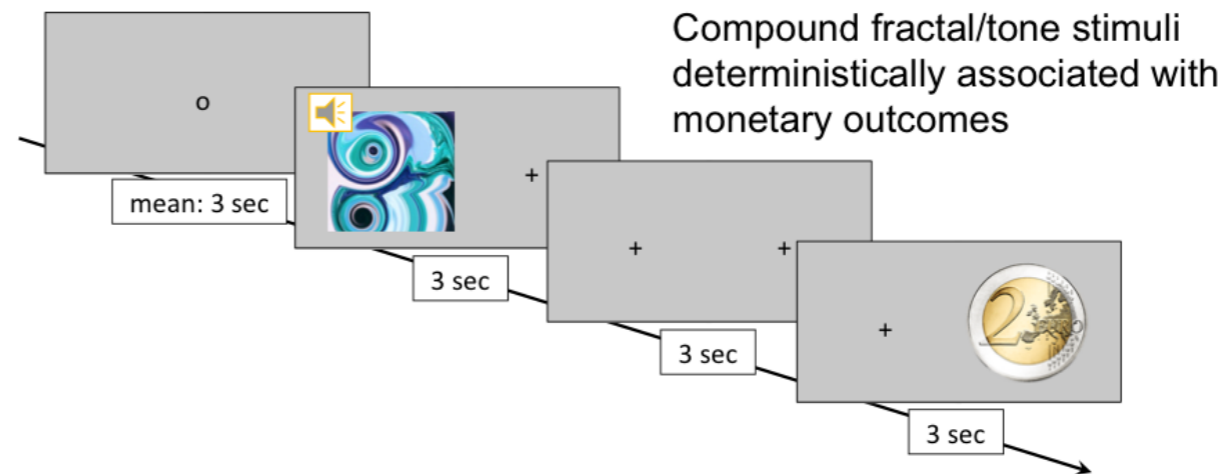


Schad, ..., Huys (2017) in prep

Sign-tracking in humans?

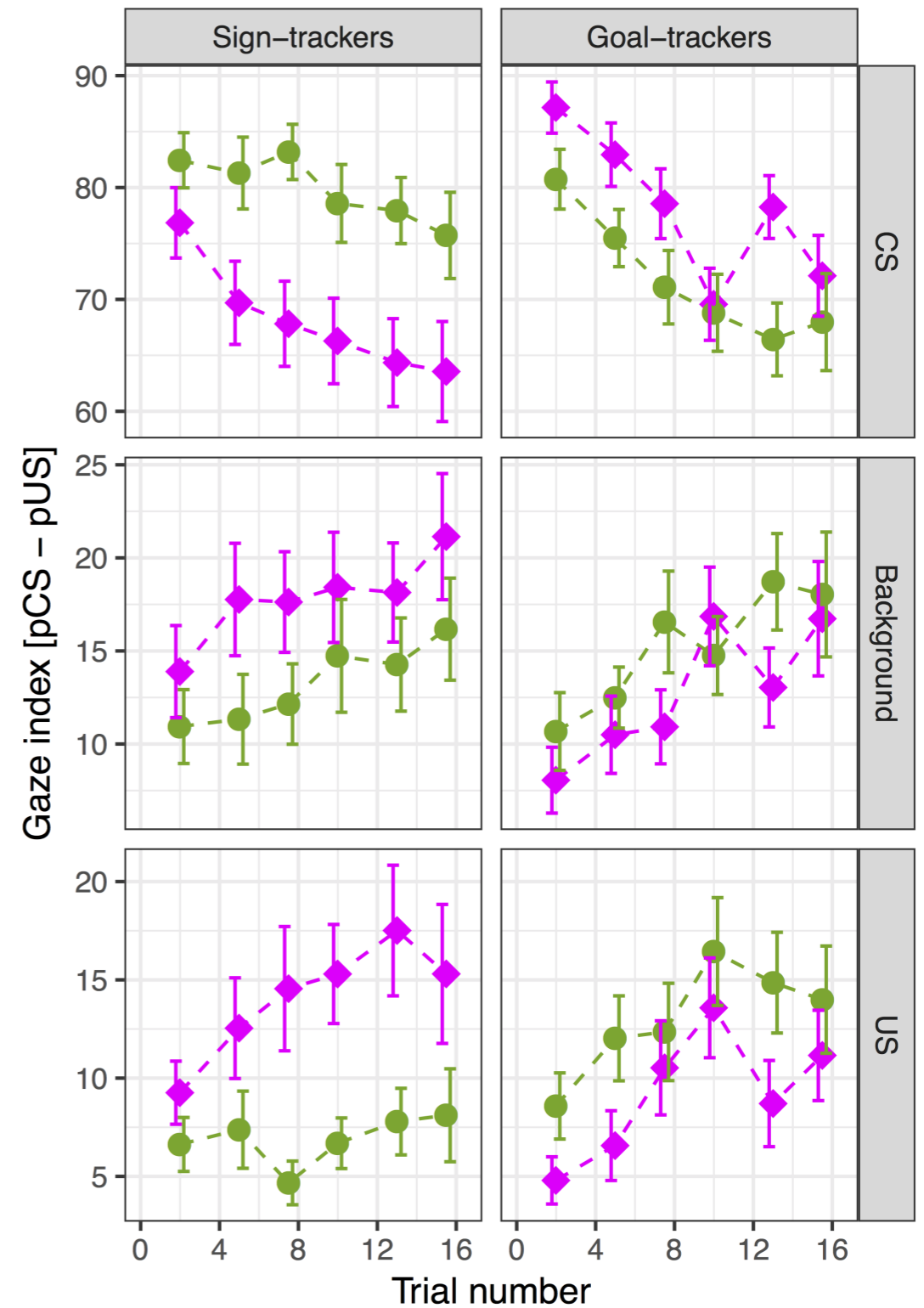
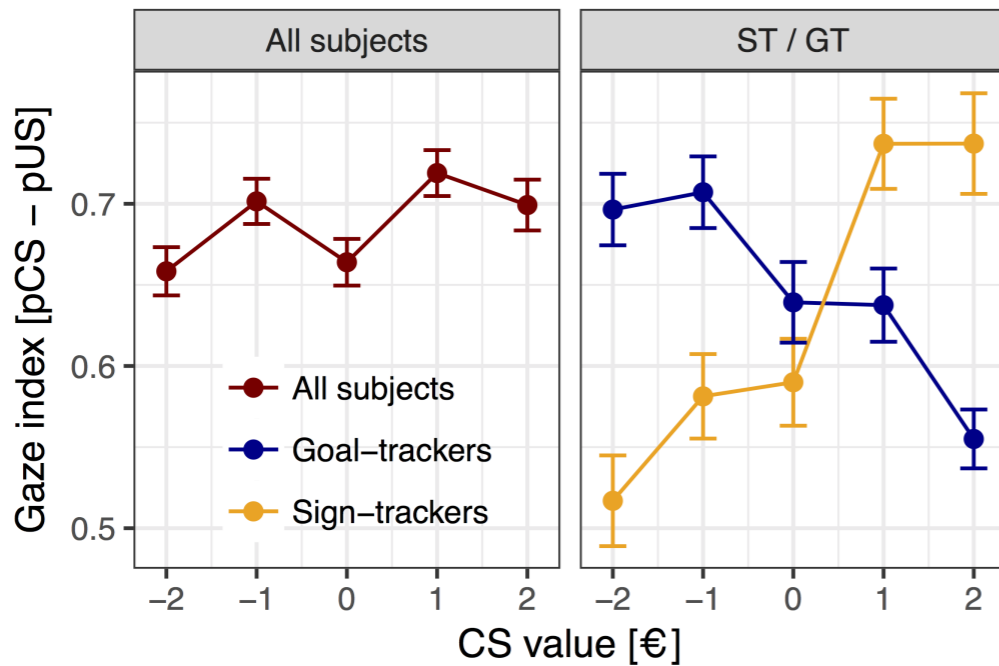
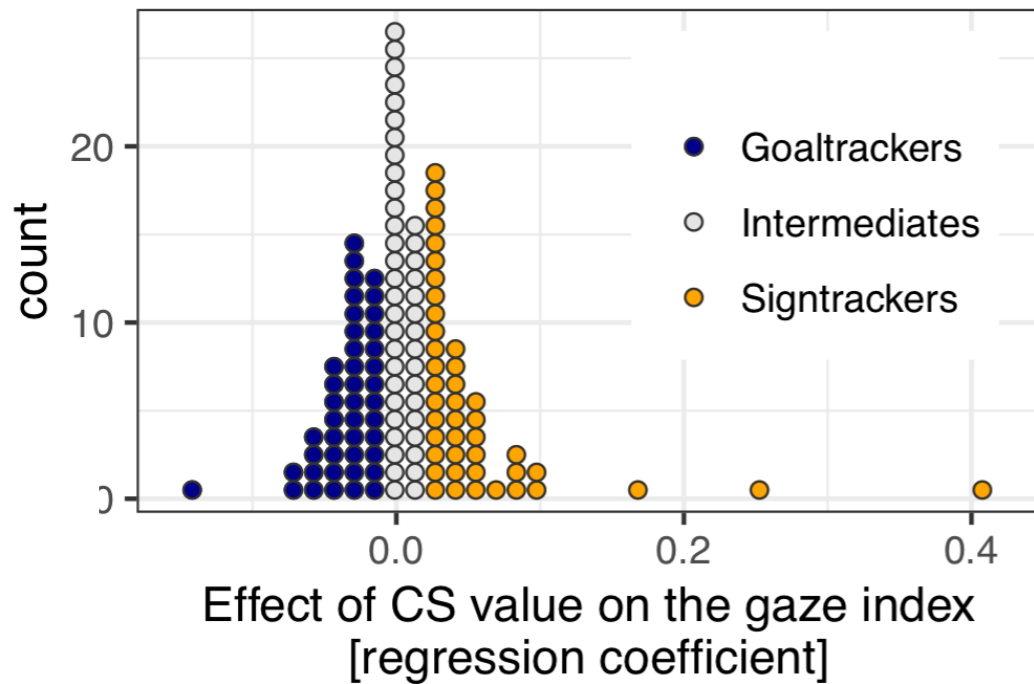
Experimental Paradigm Pavlovian Conditioning

n=129

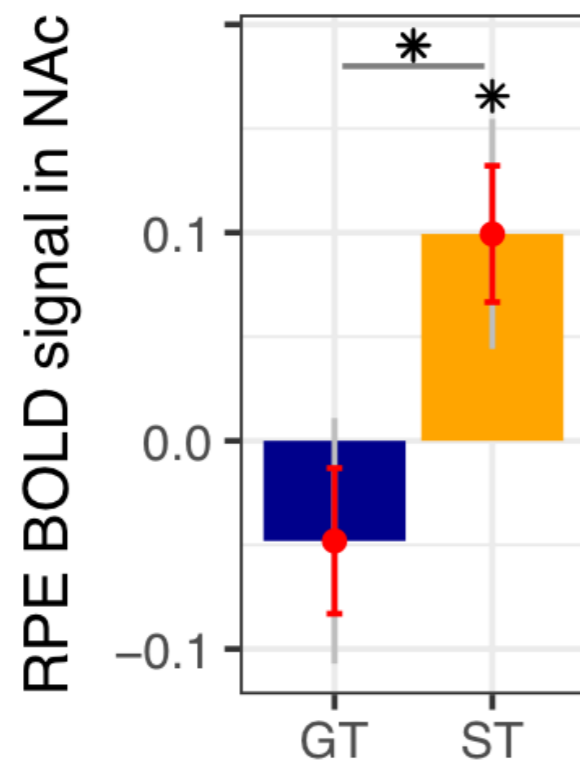


Schad, ..., Huys (2017) in prep

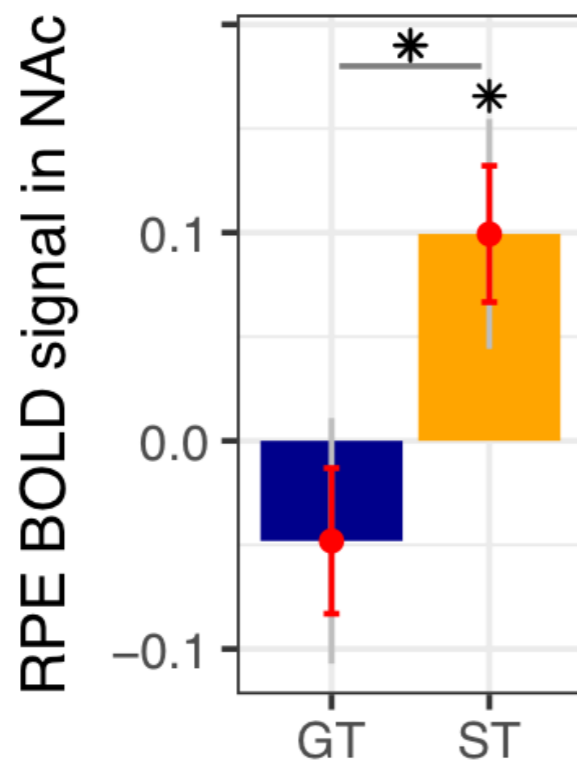
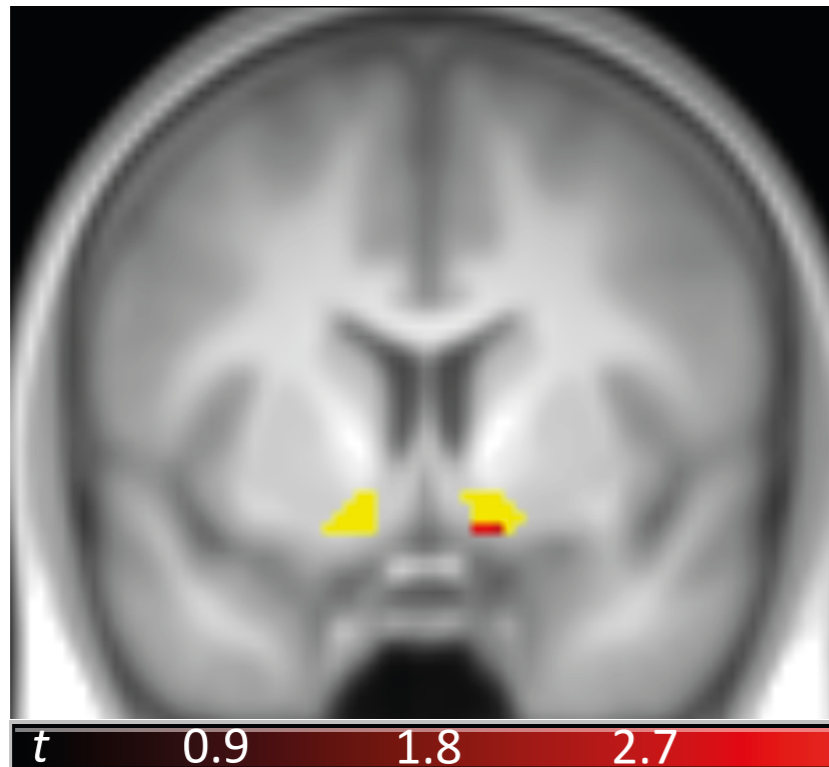
Distinguishing STs and GTs



STs only show BOLD RPE

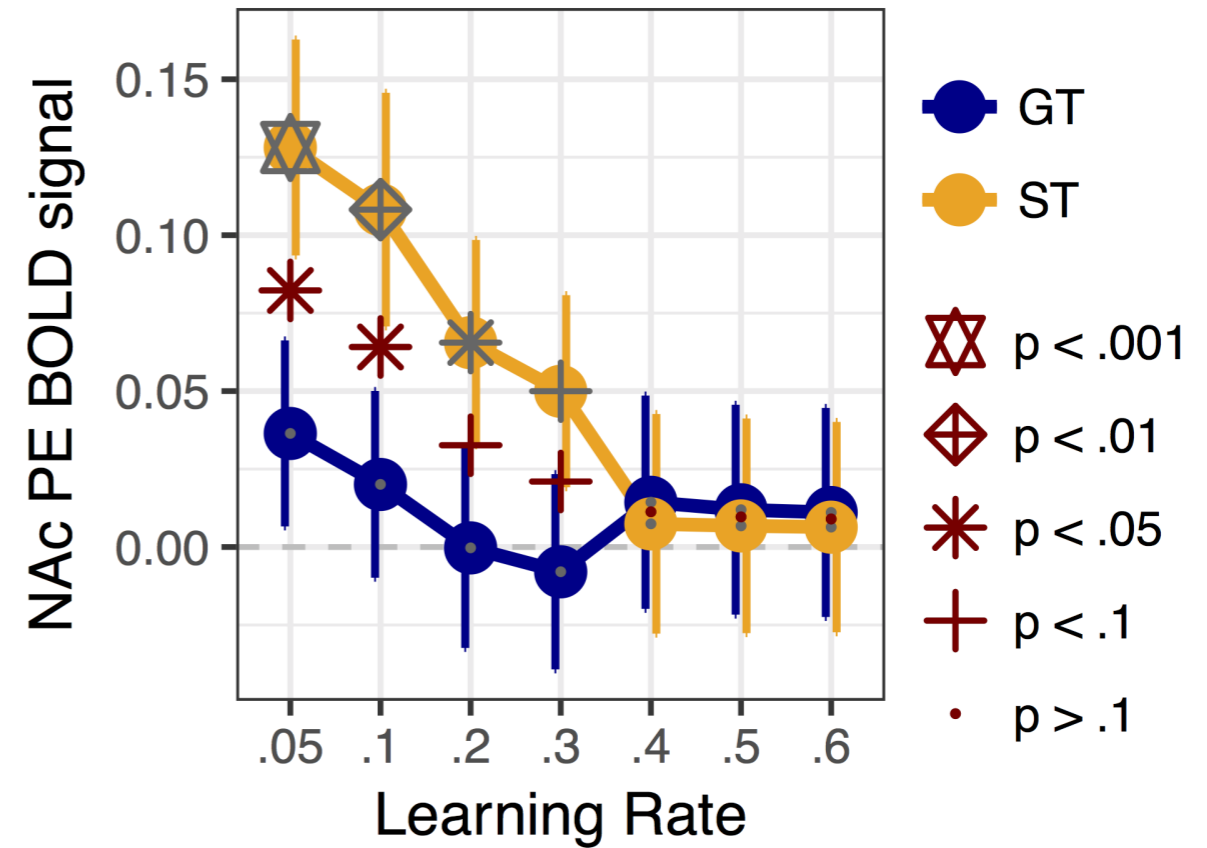
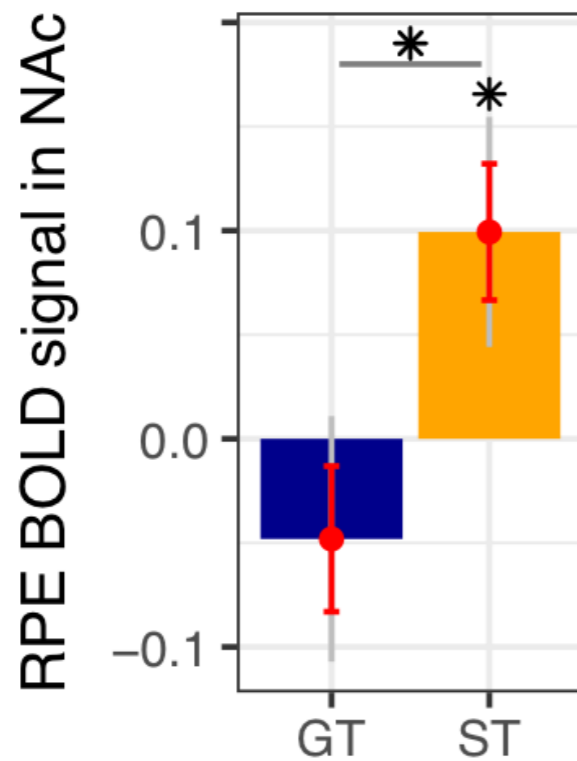
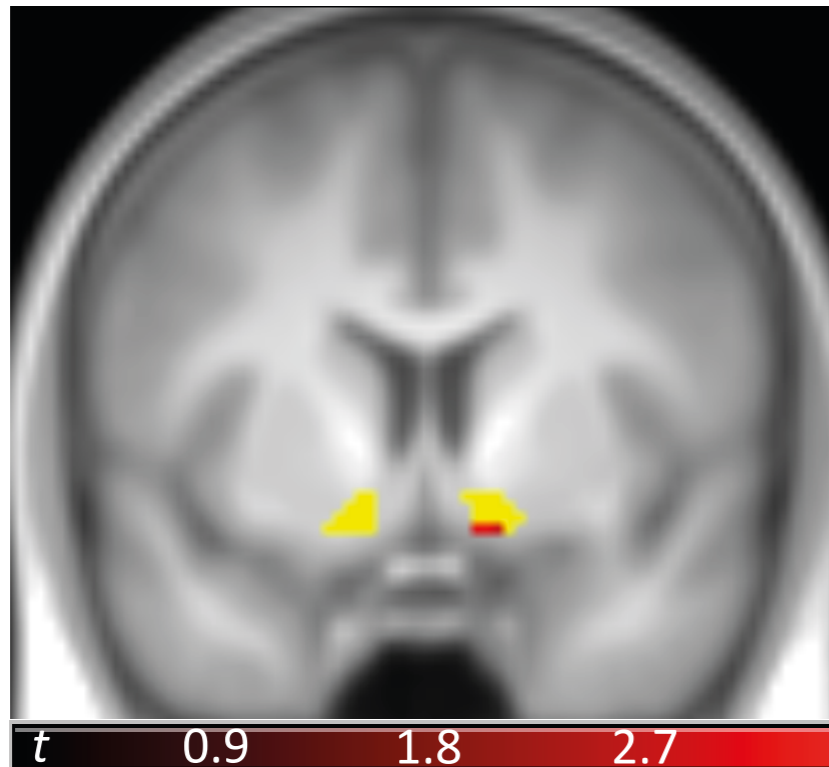


STs only show BOLD RPE



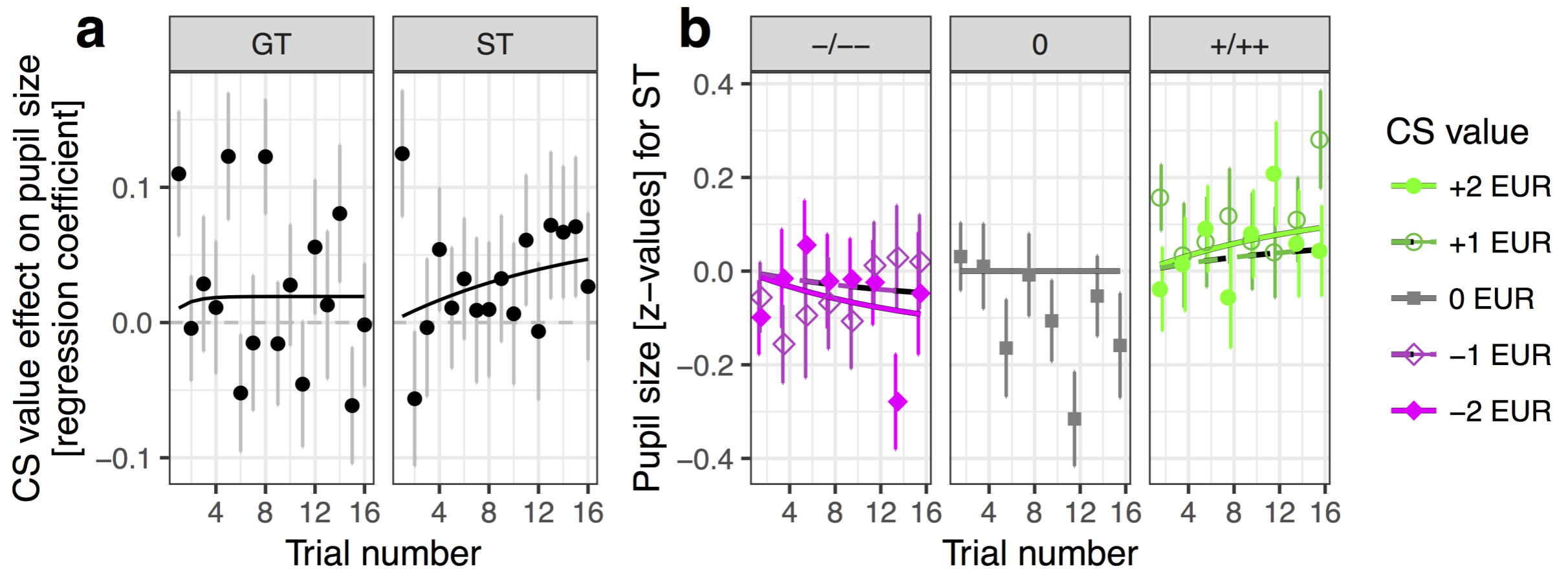
Schad, ..., Huys (2017) in prep

STs only show BOLD RPE

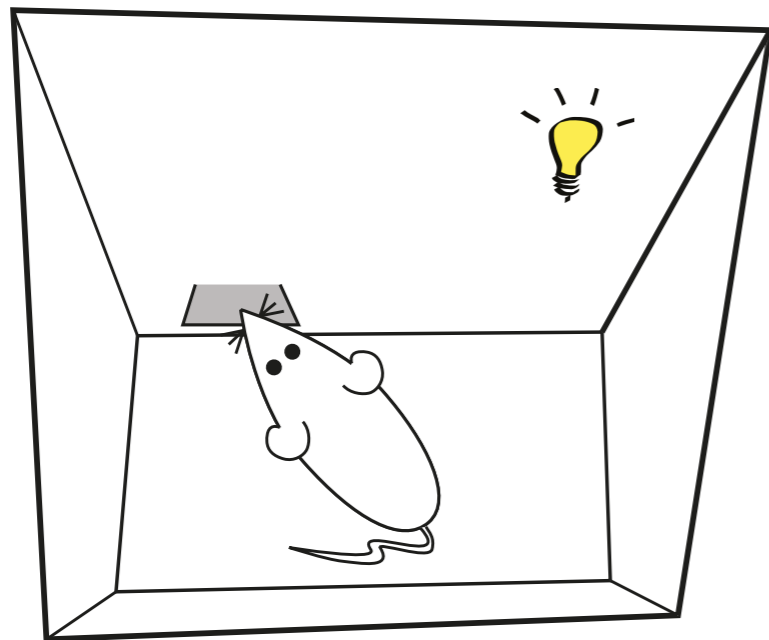
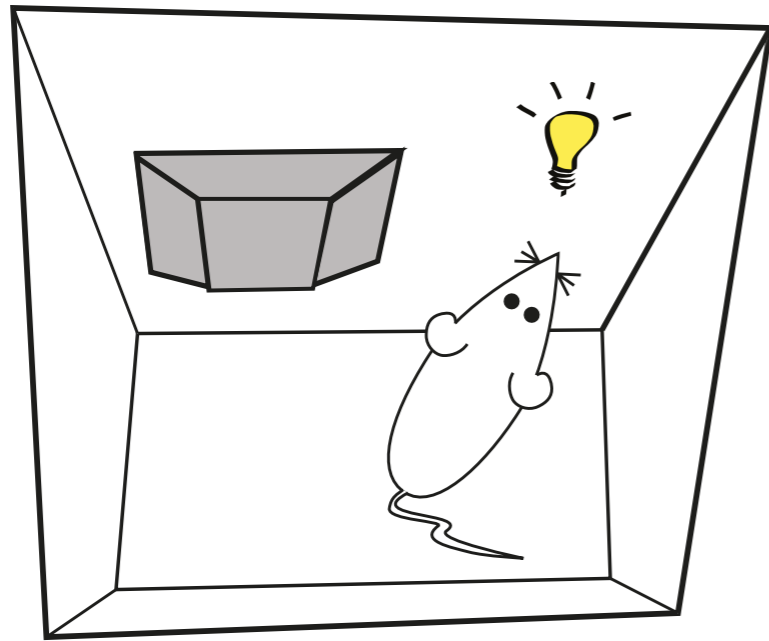


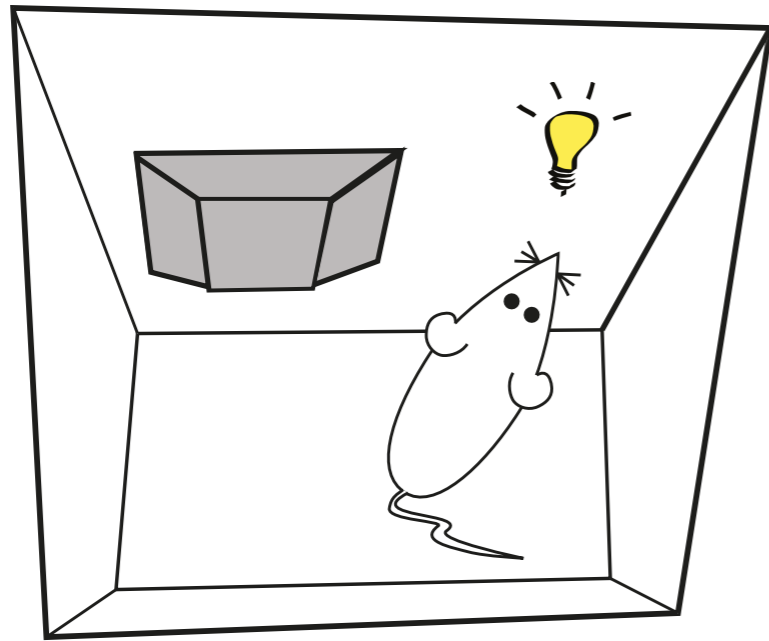
Schad, ..., Huys (2017) in prep

Pupil size accommodates in STs only

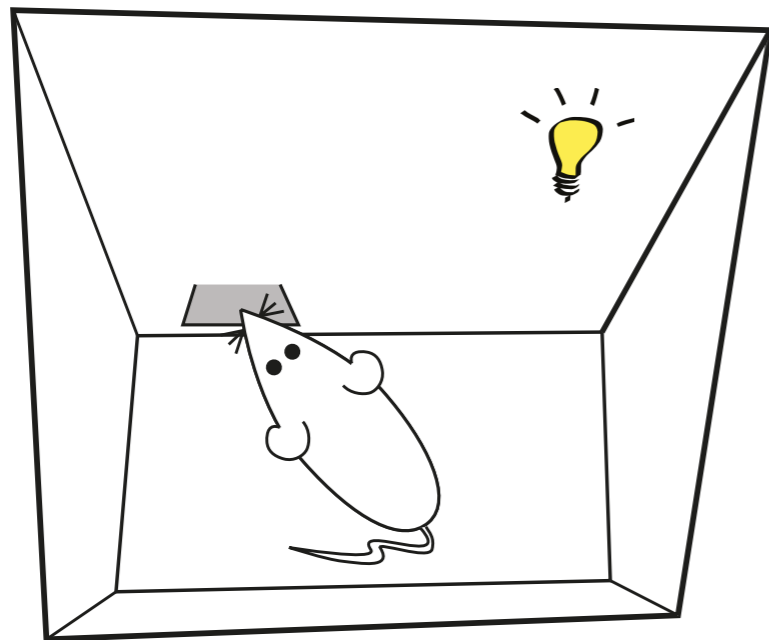


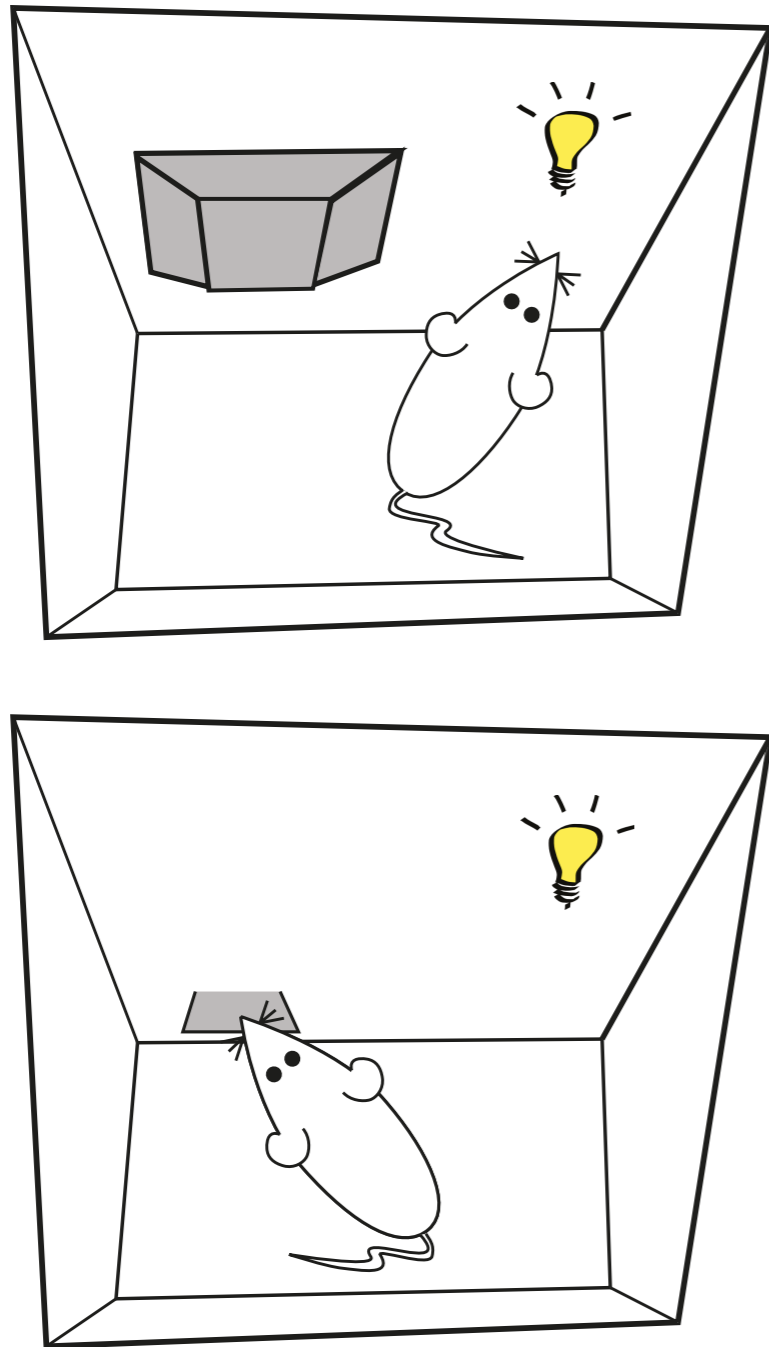
Schad, ..., Huys (2017) in prep



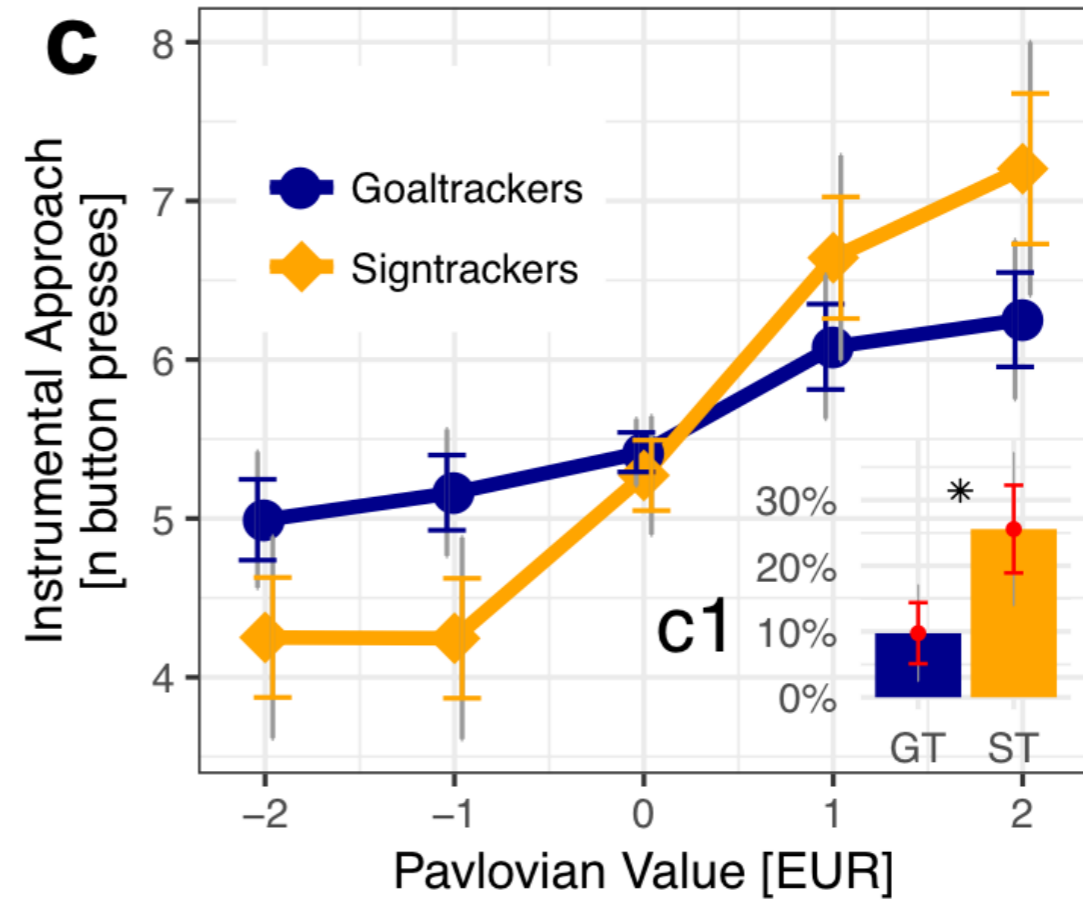


Stimulus control

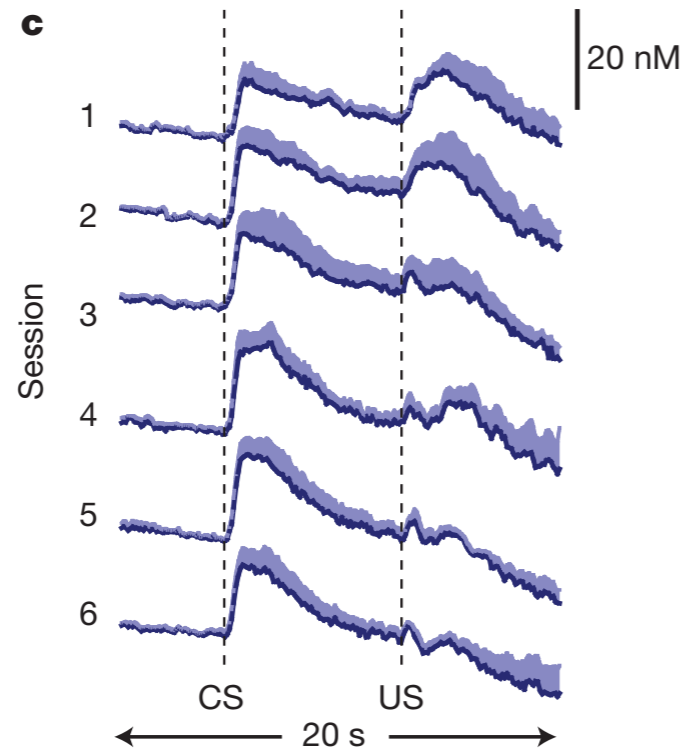




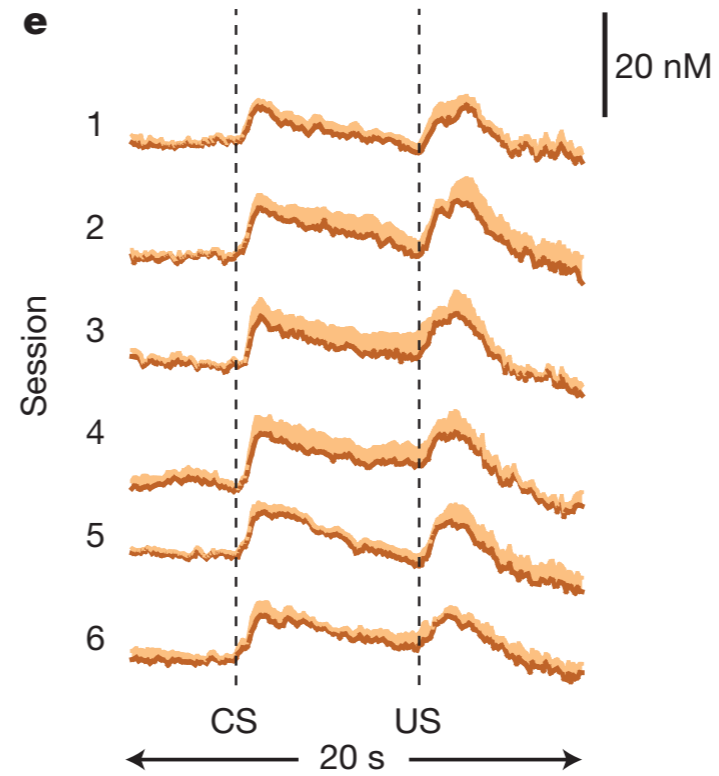
Stimulus control



Sign trackers

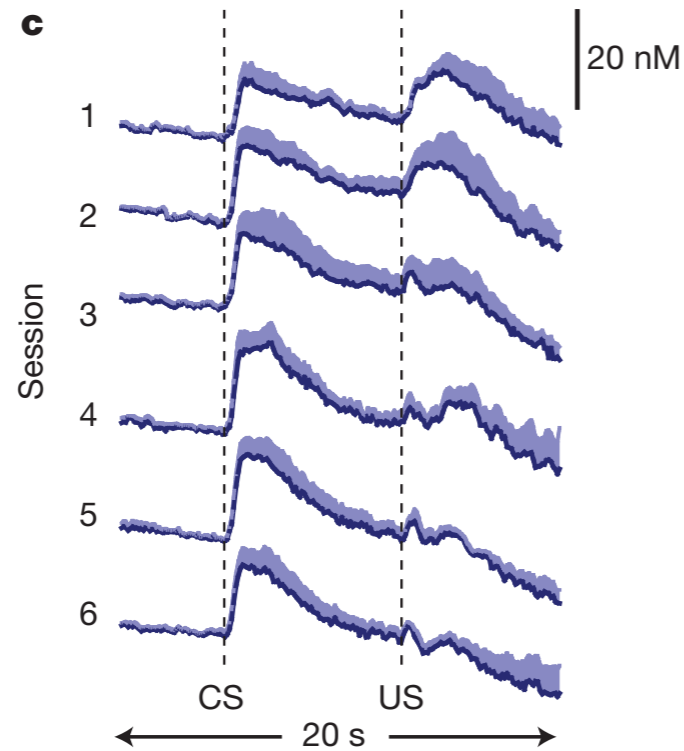


Goal trackers

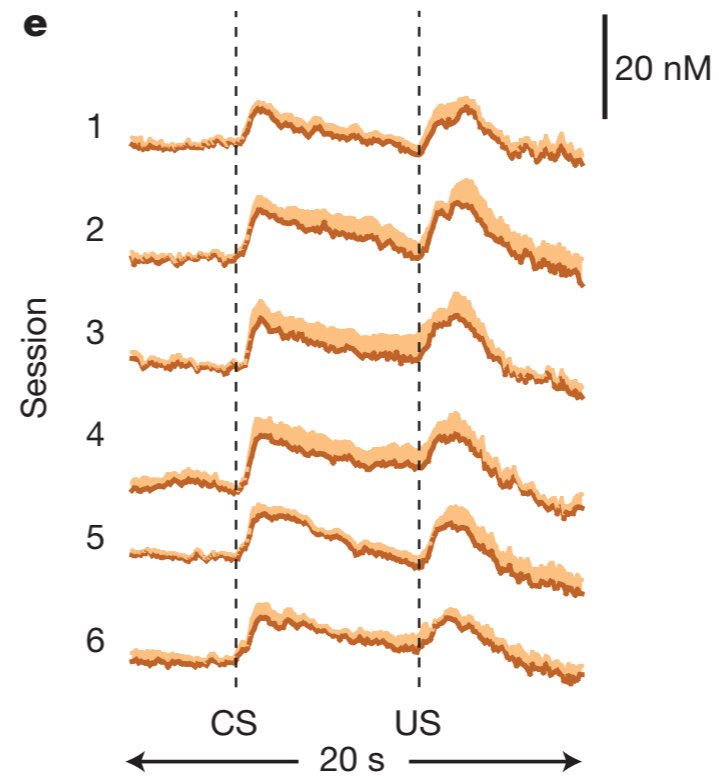


$$\delta = r - Q$$

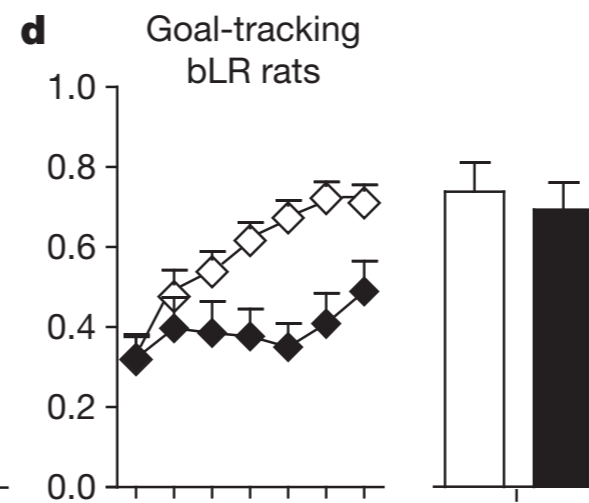
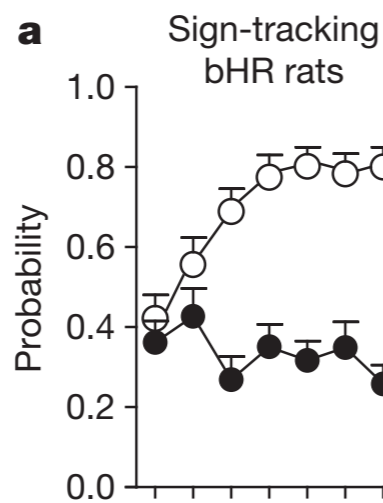
Sign trackers

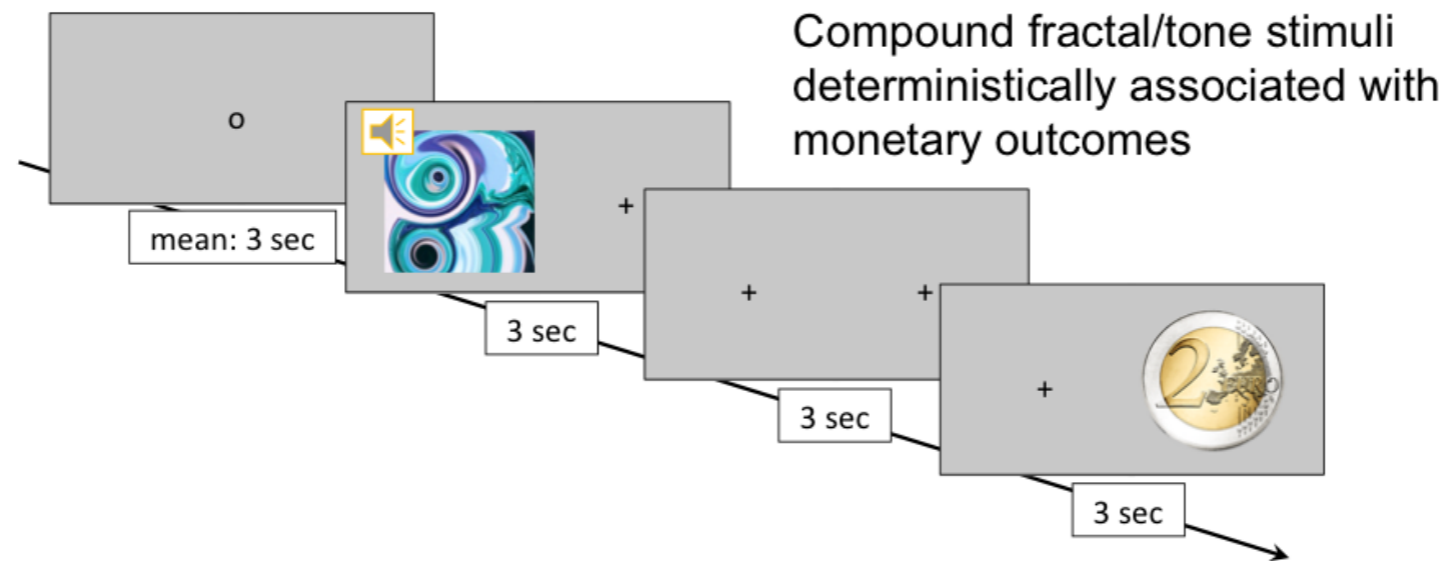


Goal trackers



$$\delta = r - Q$$





ST: learn expected value V

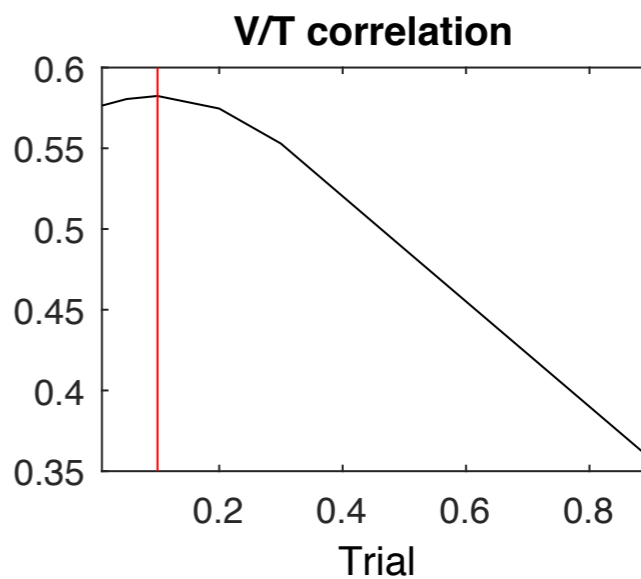
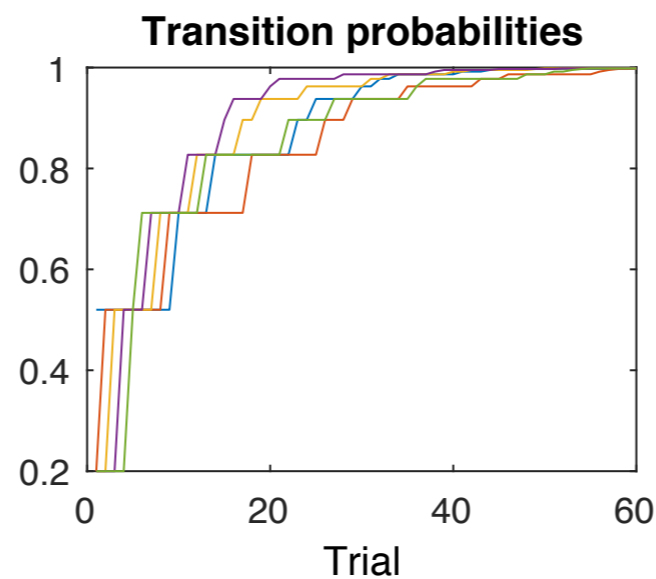
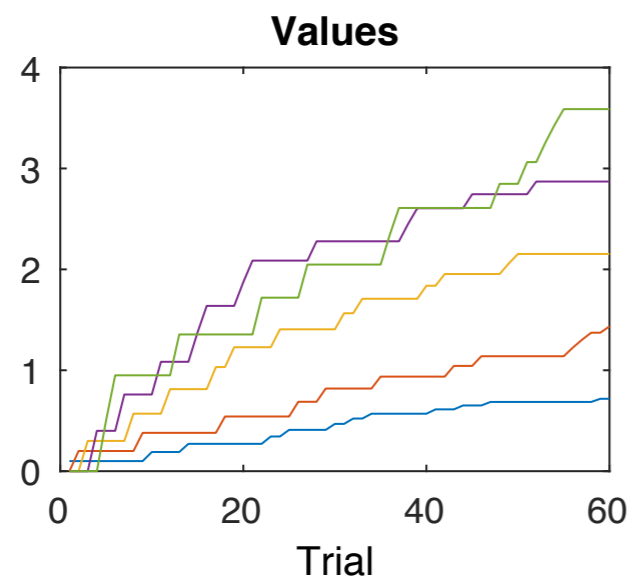
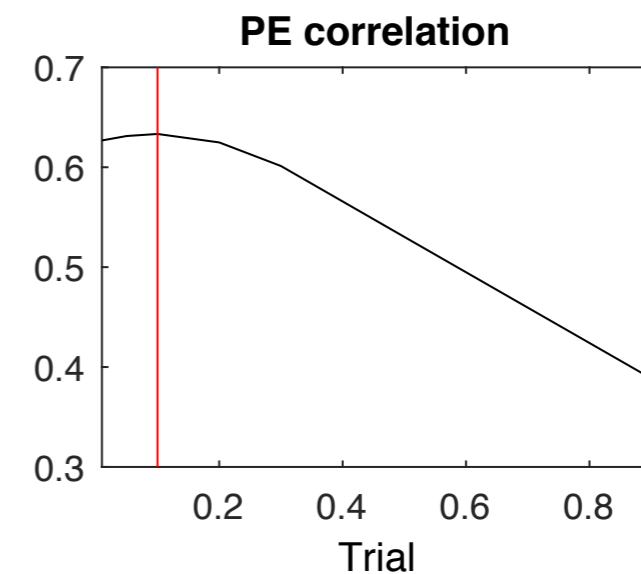
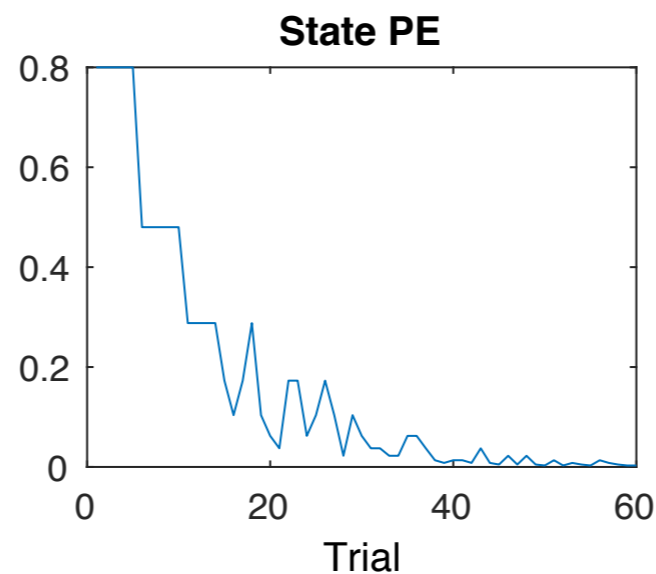
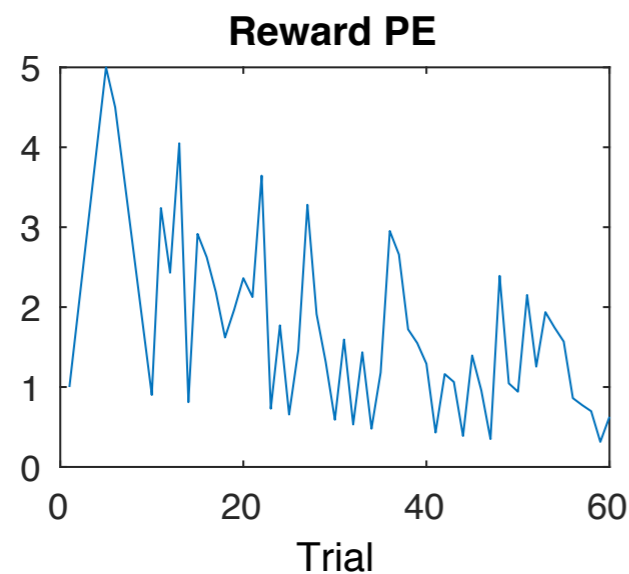
GT: learn mappings T from CS to US identity

$$\mathcal{V}(s) = \sum_a \pi(a; s) \sum_{s'} \mathcal{T}(s'|s, a) [\mathcal{R}(s', a, s) + \mathcal{V}(s')]$$

Pavlovian learning in ST vs GT

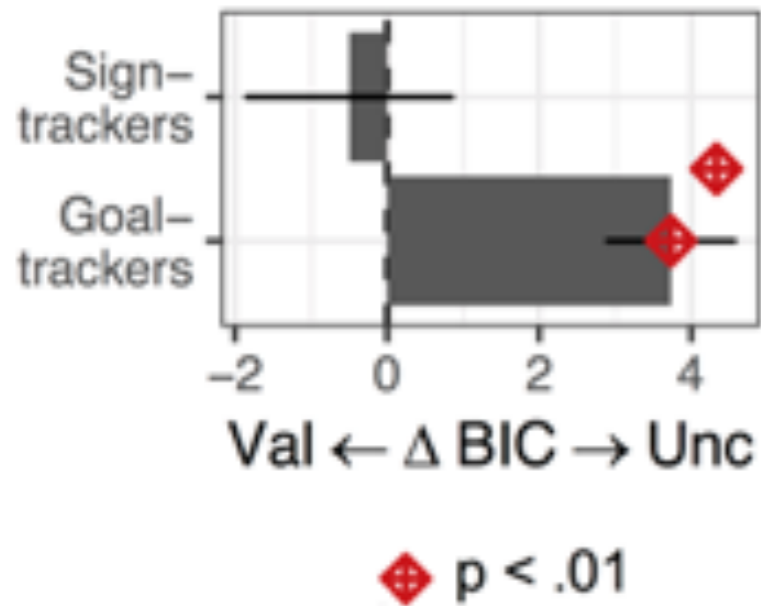
$$\mathcal{V}_t(s) = \mathcal{V}_{t-1}(s) + \alpha^r \delta_t^r$$
$$\delta_t^r = r_t - \mathcal{V}_{t-1}(s)$$

$$\mathcal{T}_t(cs, us) = \mathcal{T}_{t-1}(cs, us) + \alpha^s \delta_t^s$$
$$\delta_t^s = 1 - \mathcal{T}_{t-1}(cs, us)$$

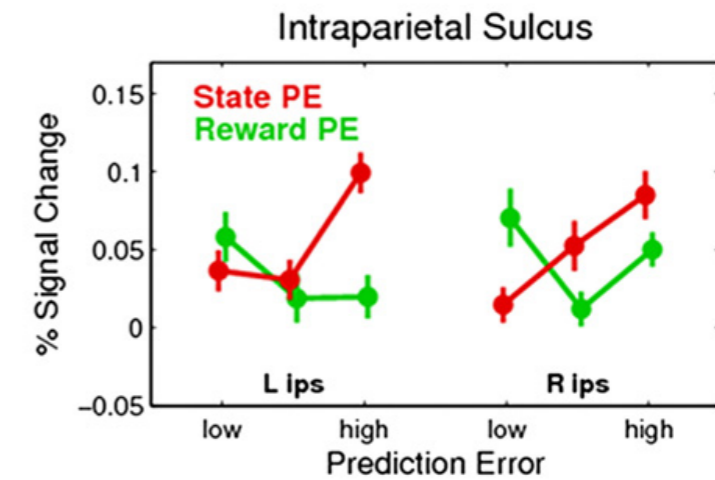
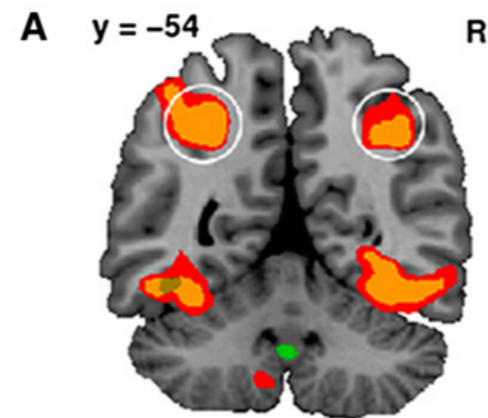


Goal-tracking signatures

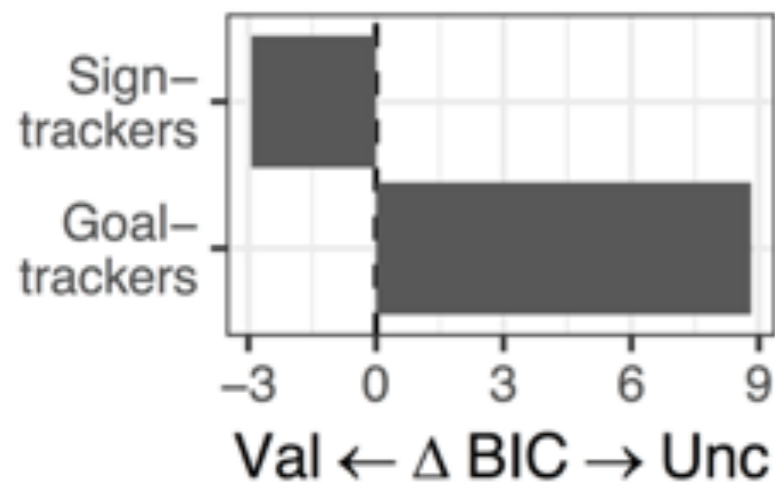
Gaze



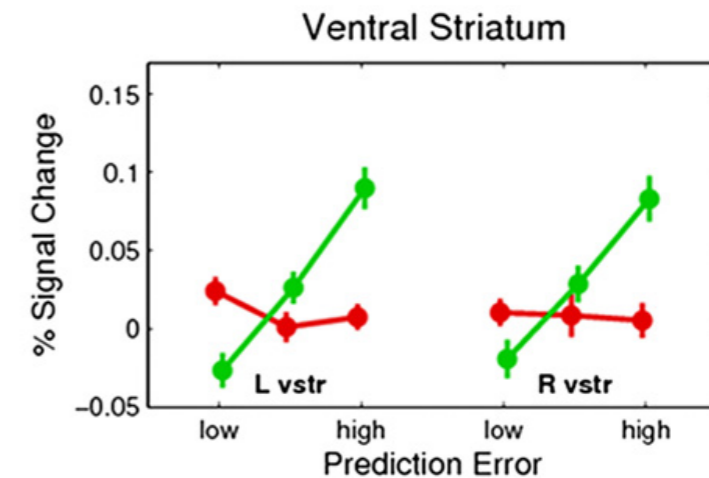
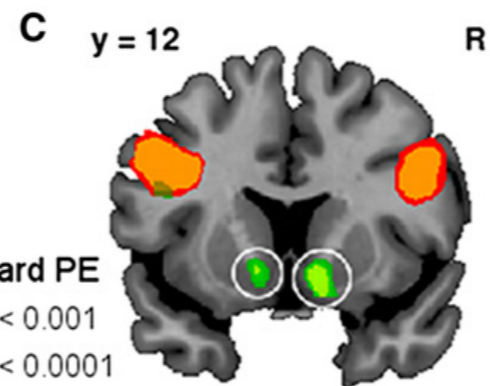
State Prediction Error



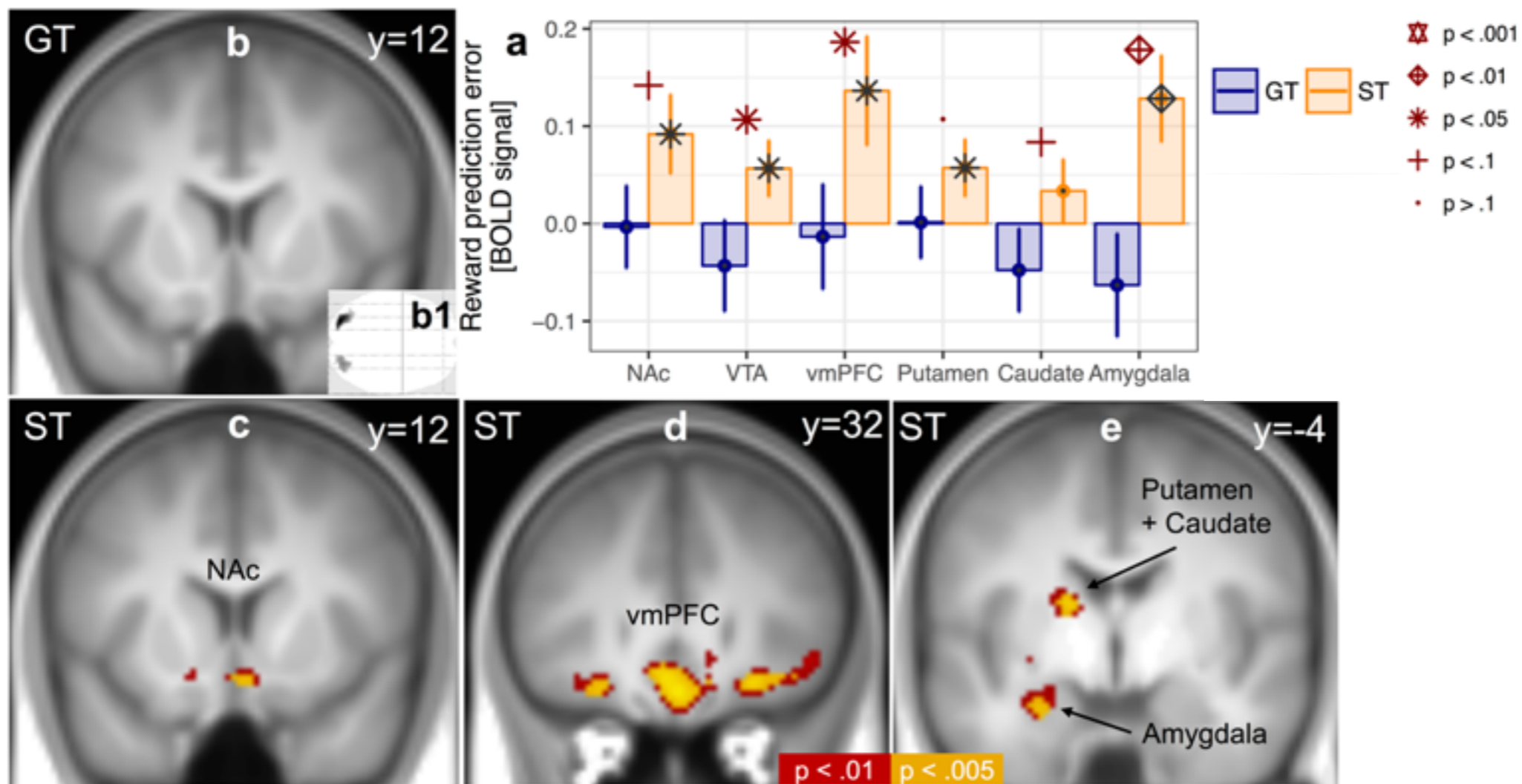
Pupil



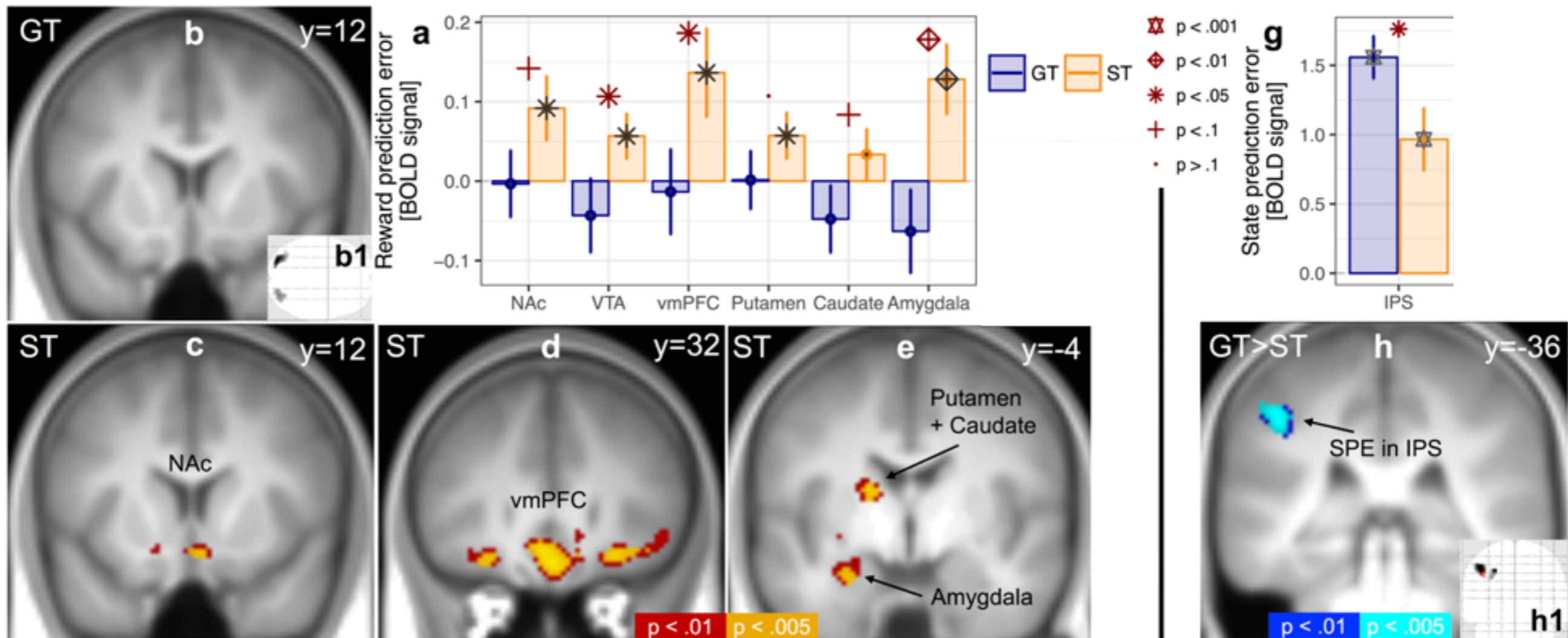
Reward Prediction Error



Double dissociation between ST and GT



Double dissociation between ST and GT

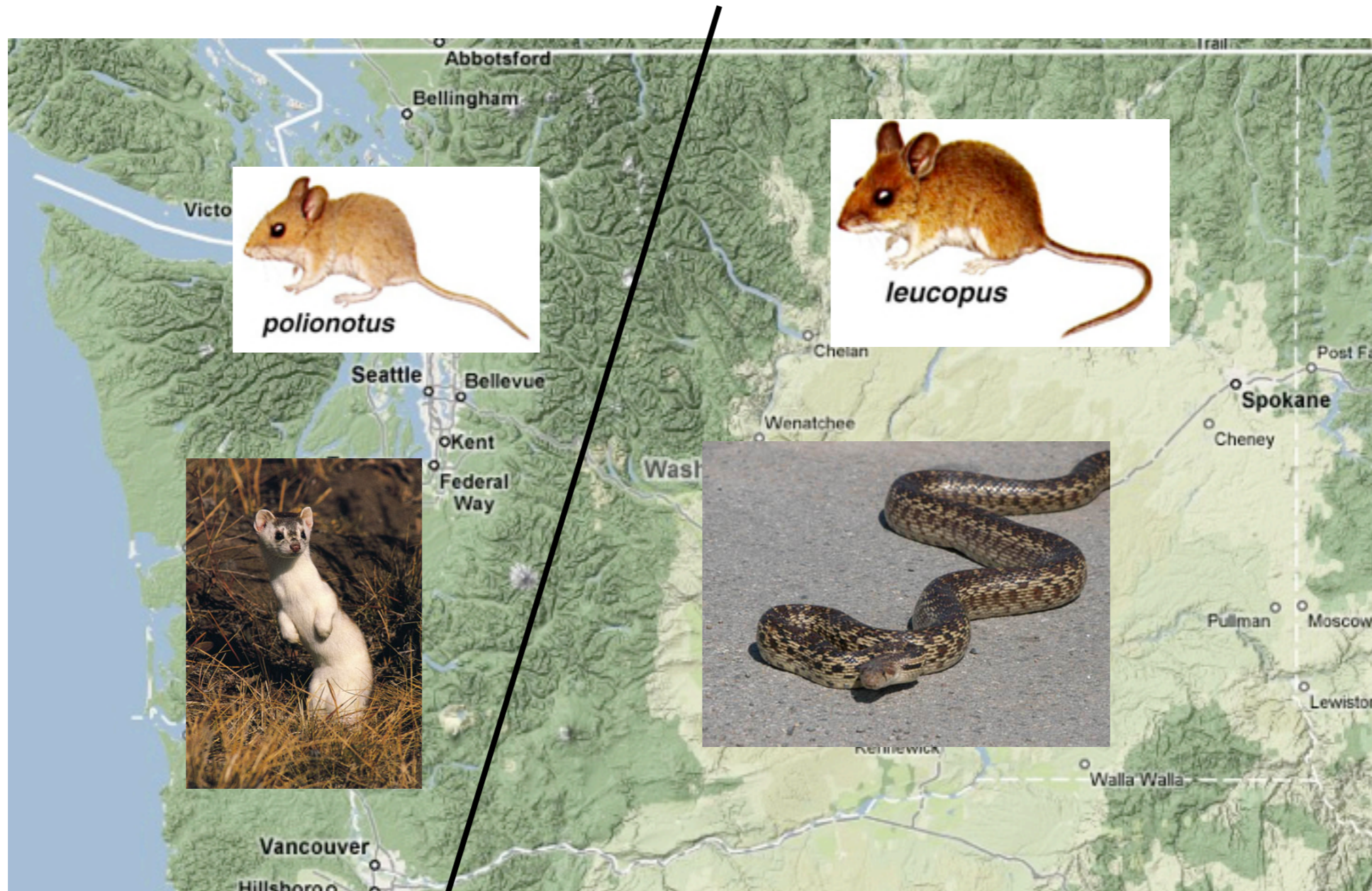


- ▶ Strong value-dependent responding exists in humans
- ▶ These can be “overcome”
- ▶ They relate to addiction
- ▶ Individual variation relates to differences in learning processes

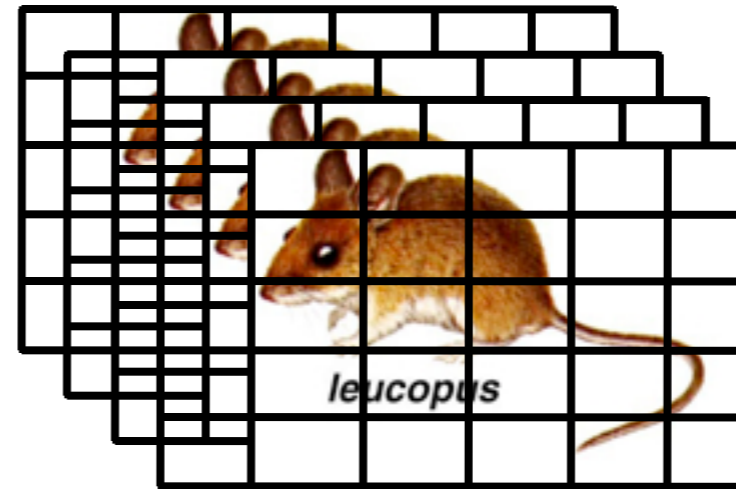
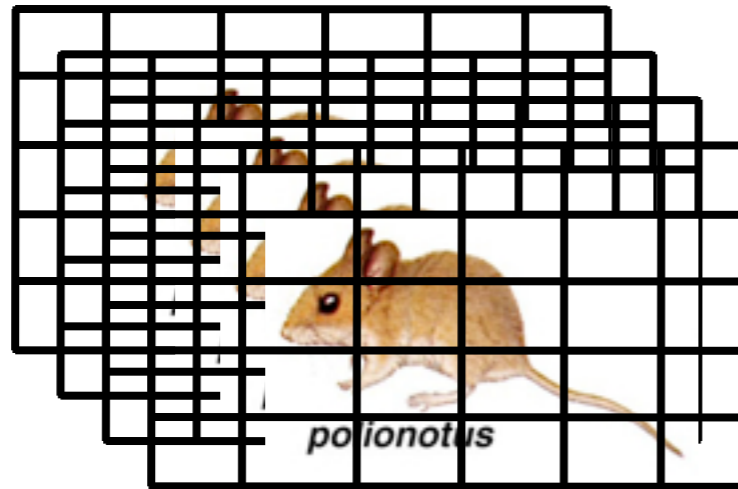
- ▶ Are these emotions?

- ▶ Innate behaviours in humans
- ▶ Are emotions Pavlovian responses?
 - Theories of emotions
- ▶ Disorders of emotion

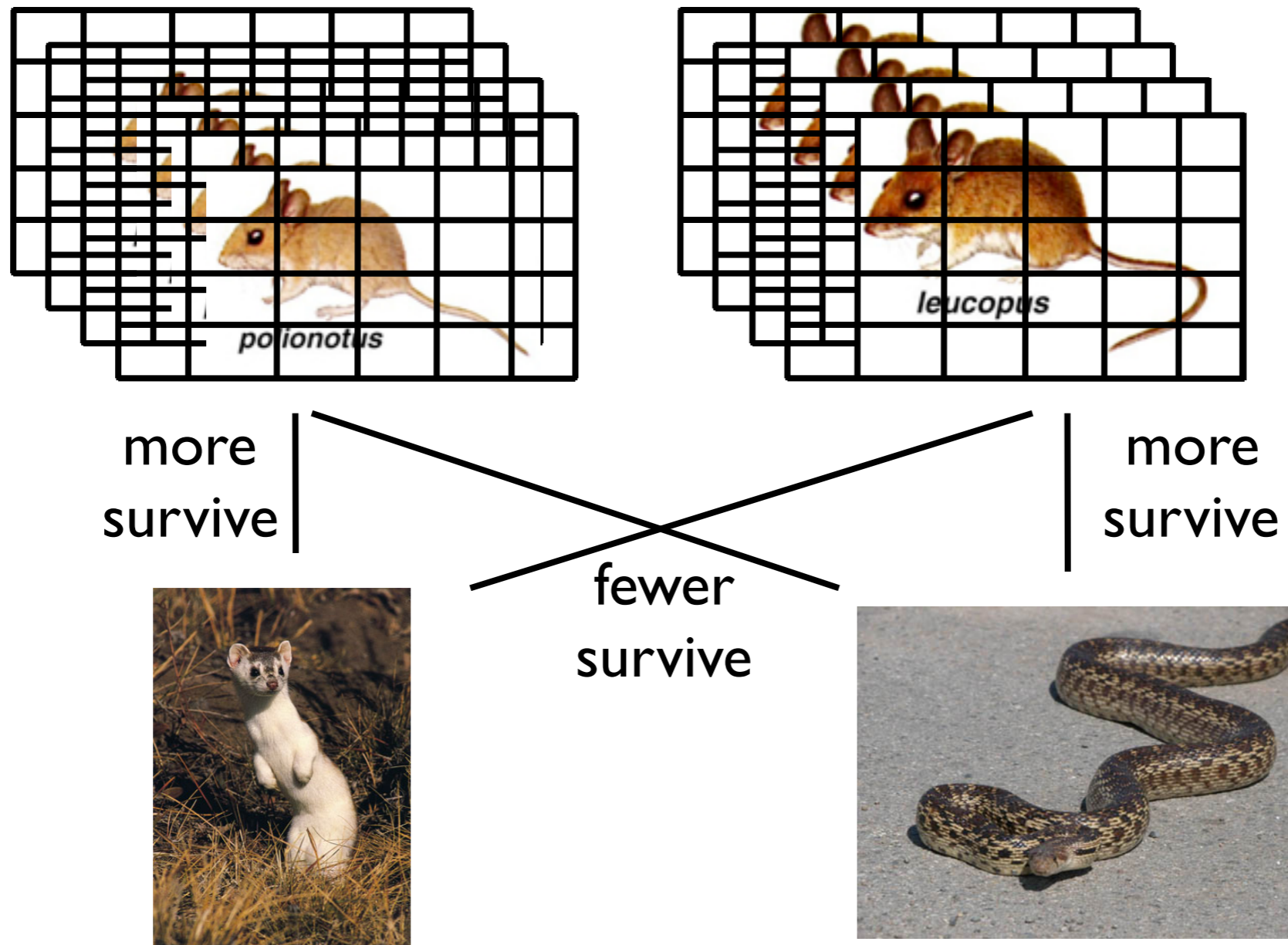
Innate evolutionary strategies



Hirsch & Bolles 1980

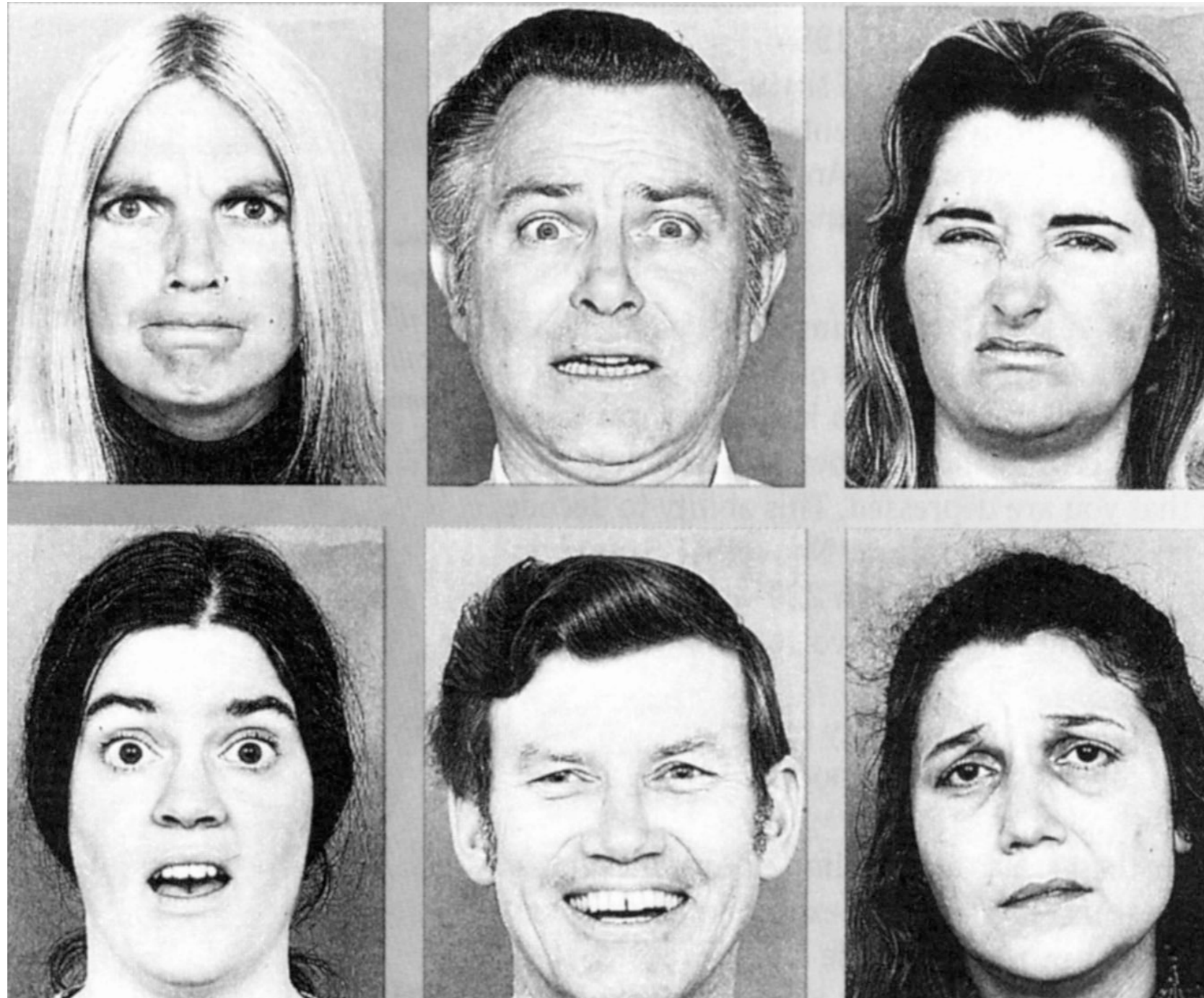


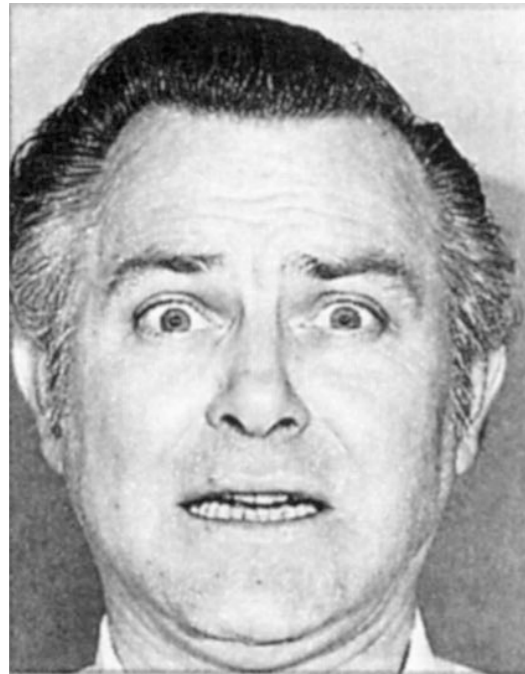
Innate evolutionary strategies



Hirsch & Bolles 1980

Facial expressions





Happiness

Sadness

Surprise

Fear

Anger

Disgust

Table 1

Single-Emotion Judgment Task: Percentage of Subjects Within Each Culture Who Chose the Predicted Emotion

Nation	Happiness	Surprise	Sadness	Fear	Disgust	Anger
Estonia	90	94	86	91	71	67
Germany	93	87	83	86	61	71
Greece	93	91	80	74	77	77
Hong Kong	92	91	91	84	65	73
Italy	97	92	81	82	89	72
Japan	90	94	87	65	60	67
Scotland	98	88	86	86	79	84
Sumatra	69	78	91	70	70	70
Turkey	87	90	76	76	74	79
United States	95	92	92	84	86	81

Table 2

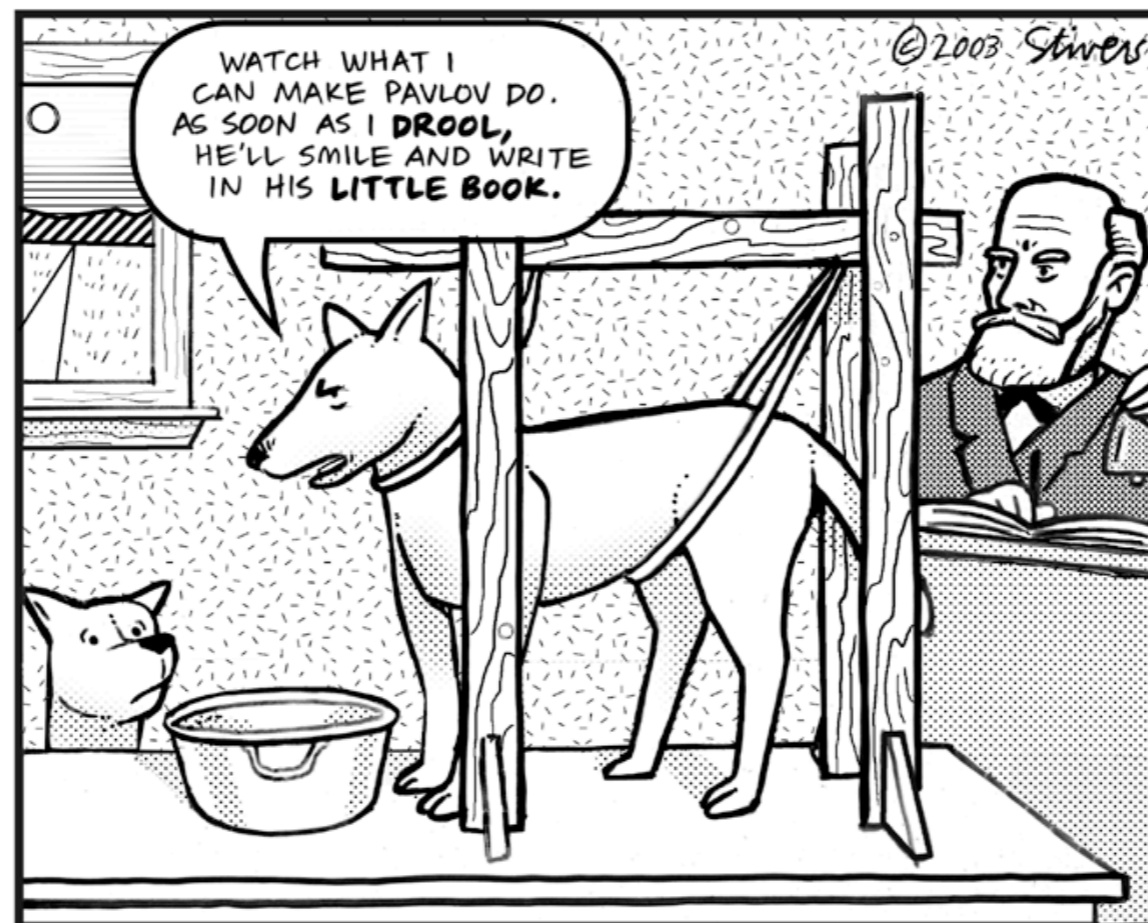
Kappa Coefficients

Nation	Single judgments	Multiple judgments
Estonia	.790	.744
Germany	.736	.739
Greece	.762	.789
Hong Kong	.763	.718
Italy	.800	.783
Japan	.693	.678
Scotland	.815	.809
Sumatra	.657	.541
Turkey	.729	.738
United States	.835	.607

Note. All figures are significant beyond .001.

Ekman et al., 1972 Pers. Proc. Individ. Diff.

- ▶ Emotions as “complex actions”
 - akin to Pavlovian reflexes
 - computational models capture how expression changes with experience



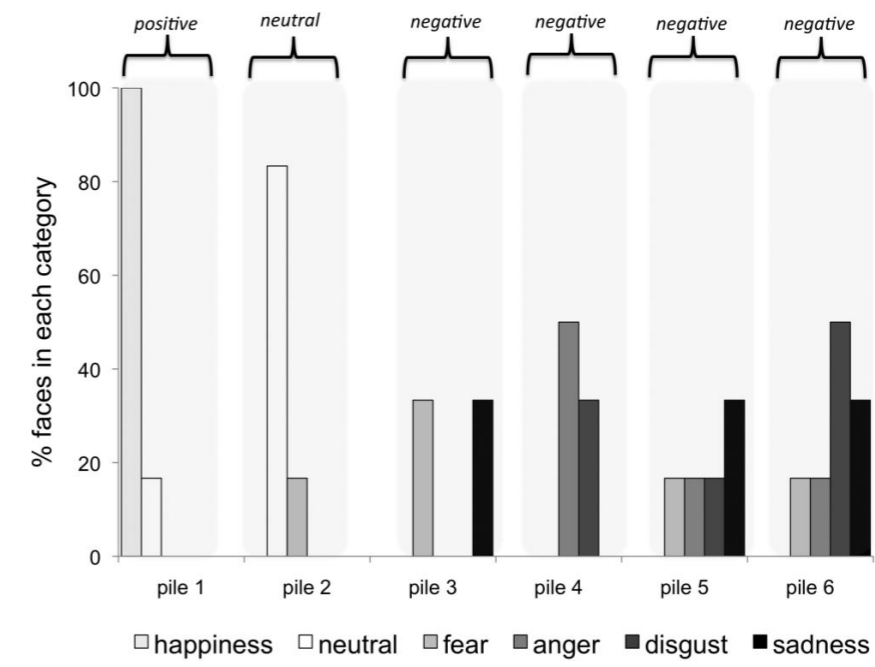
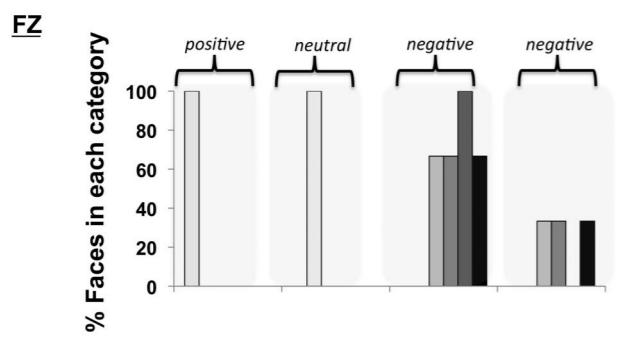
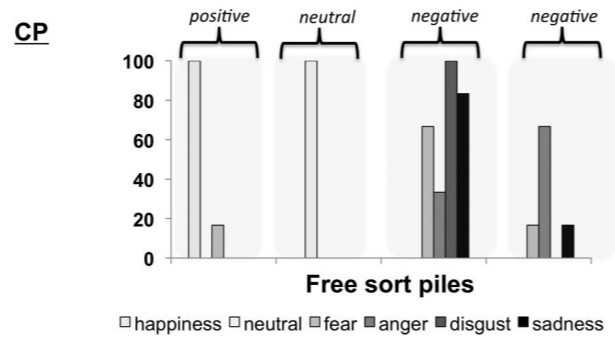
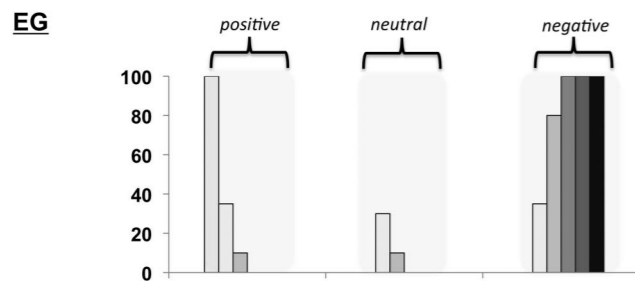
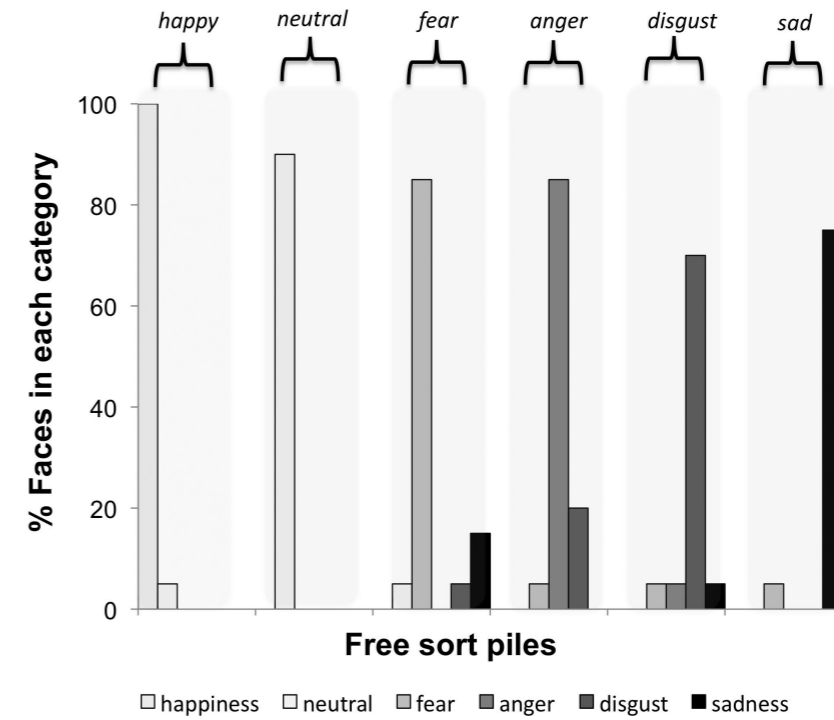
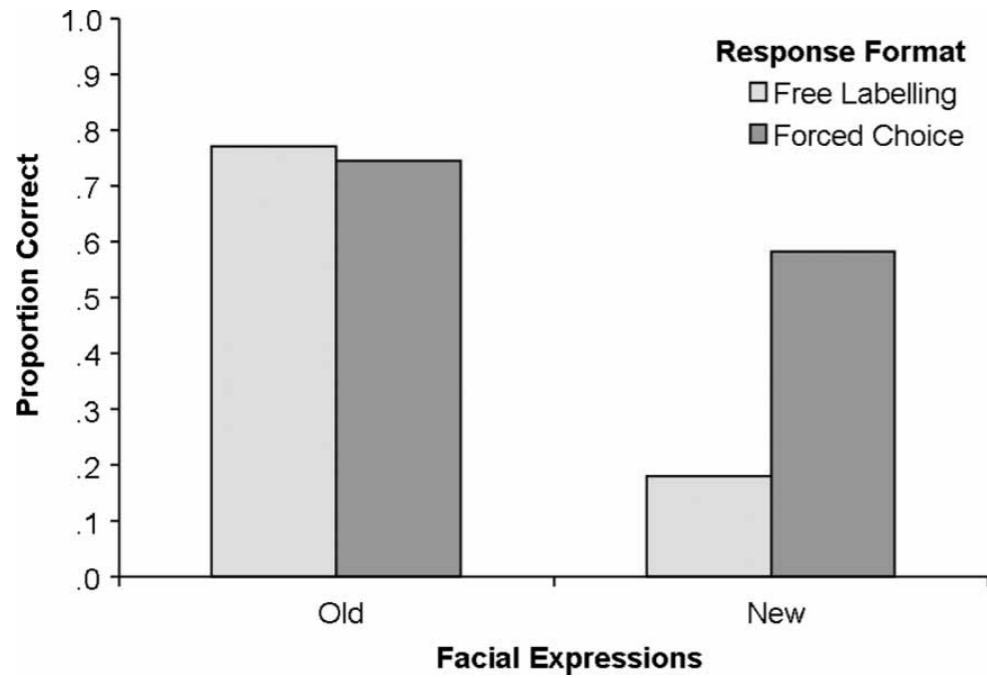
- ▶ Treat as “complex actions”
 - Basic emotion view
 - Action tendencies are important
 - Most prominent approach
 - Inflexibility -> Pavlovian account

$$p(a; s) \propto Q(a, s)$$

$$p(a(c(s))) \propto V(s)$$



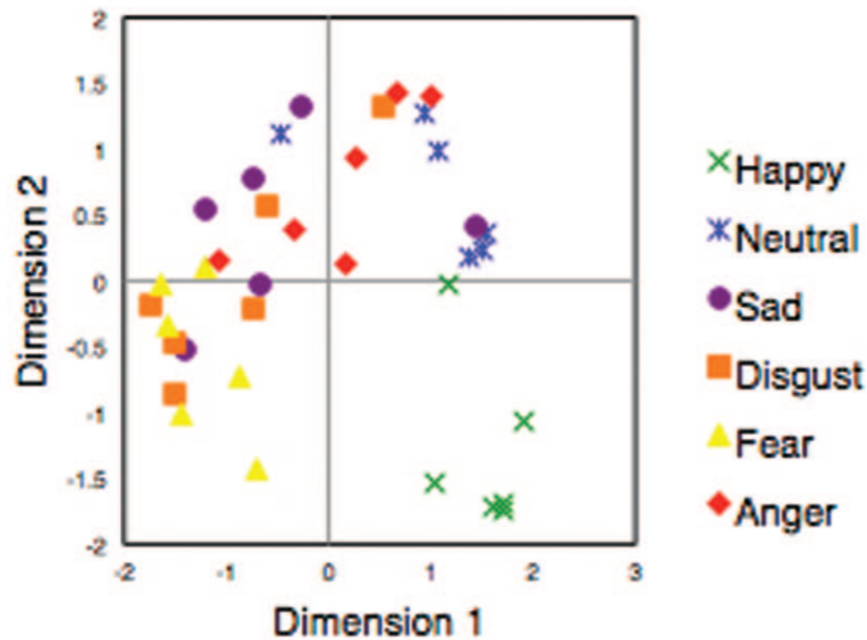
Facial expressions



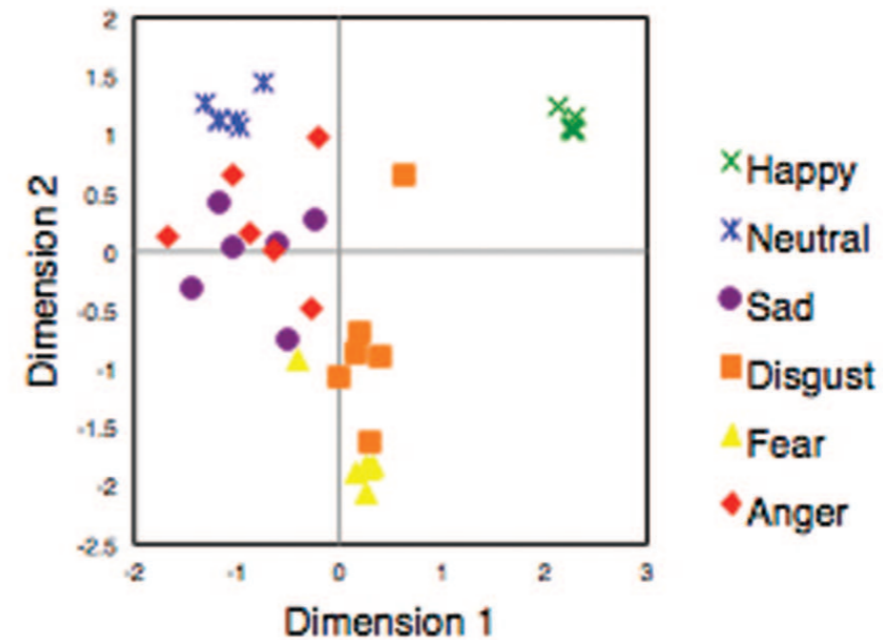
Widen et al., 2010, Lindquist et al., 2006 2014

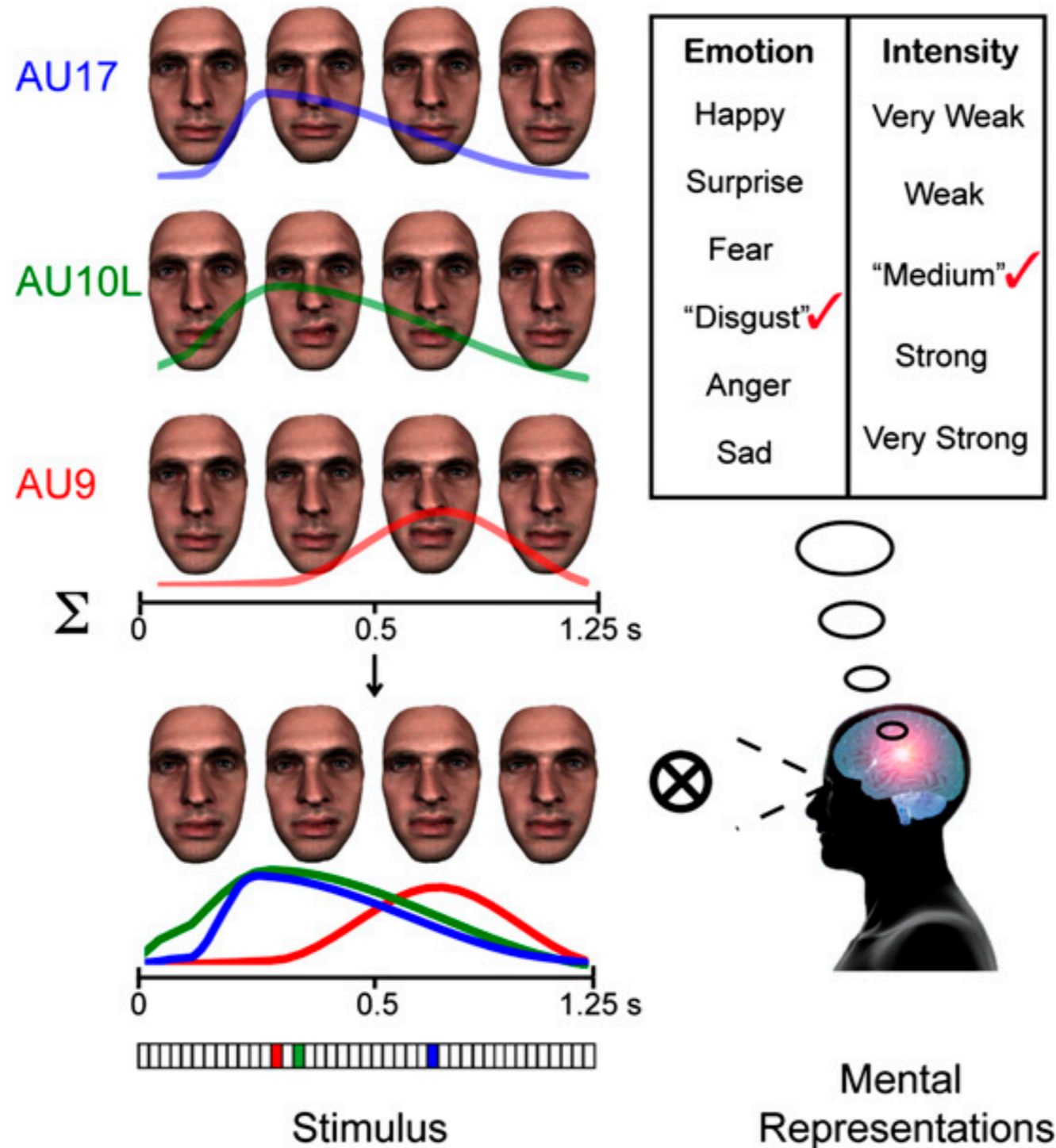
Free sorting in remote cultures

A Himba Free Sorting

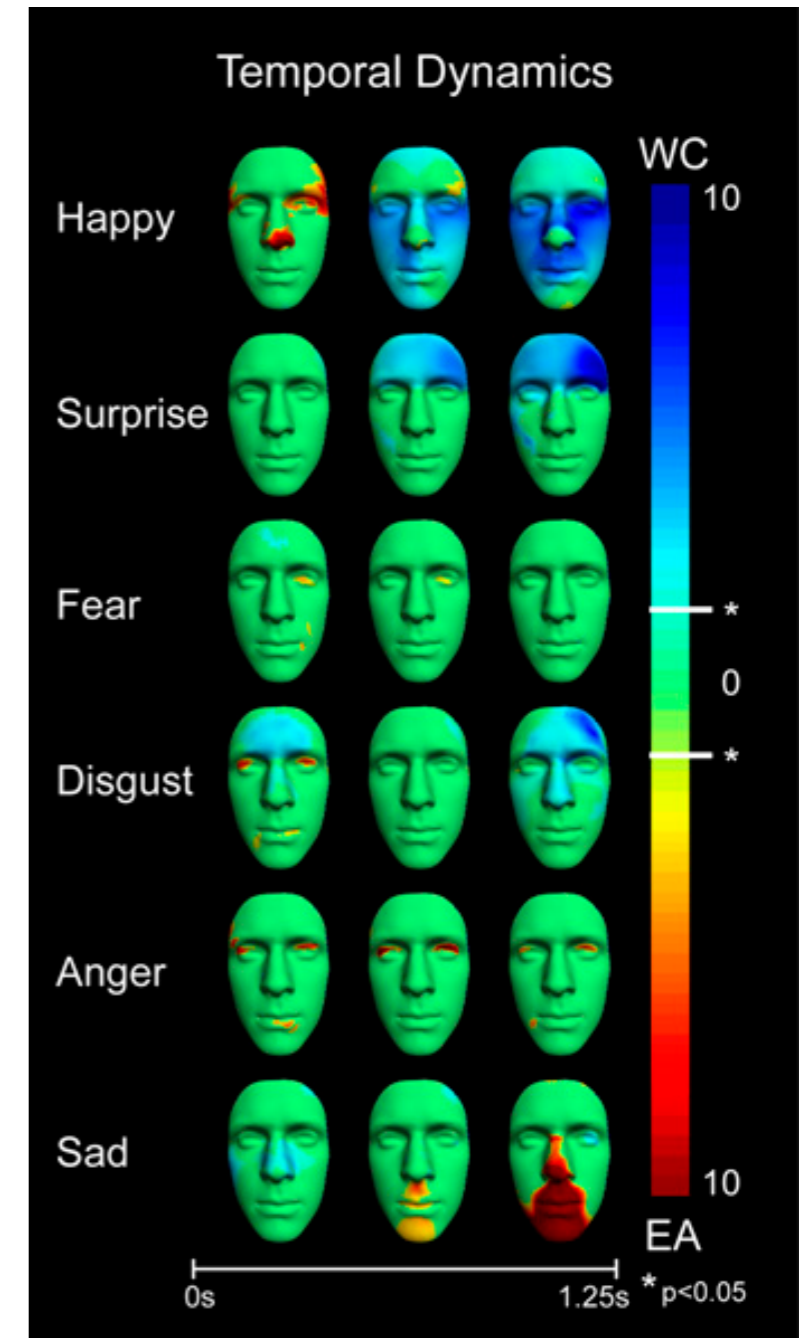
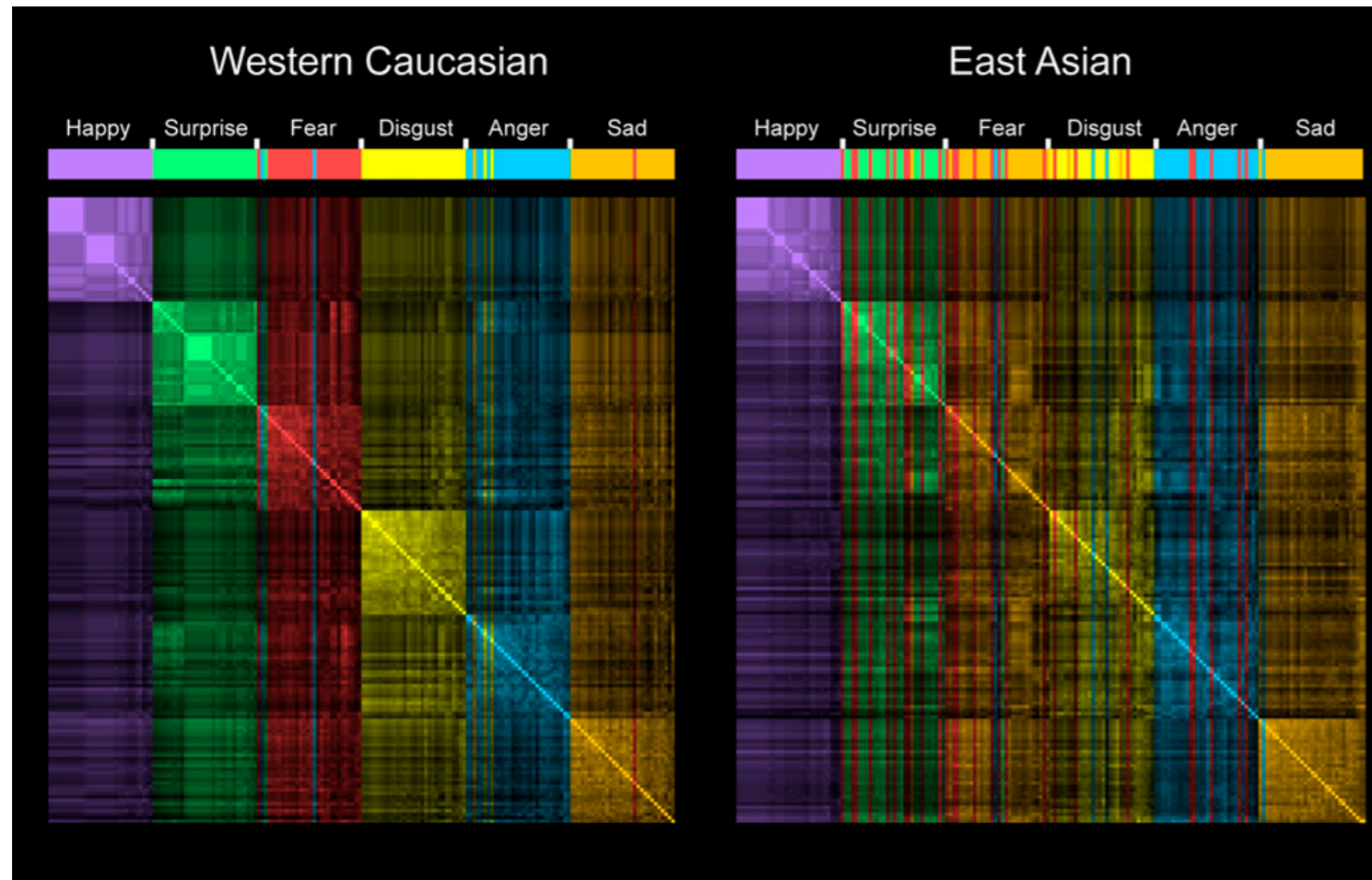


B American Free Sorting





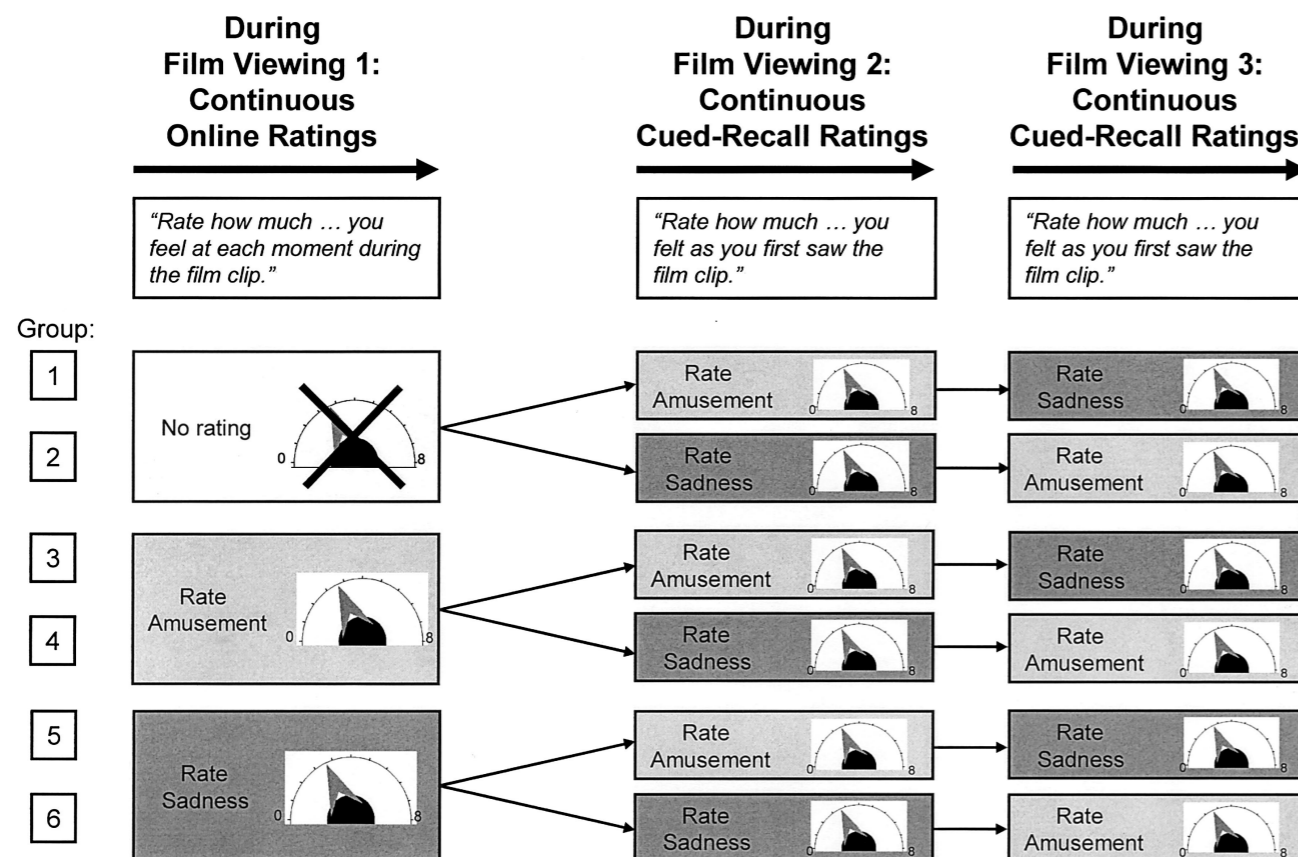
Facial emotion recognition



Jack et al., 2012 PNAS

- ▶ Weak correlations between experience, facial expression & physiology

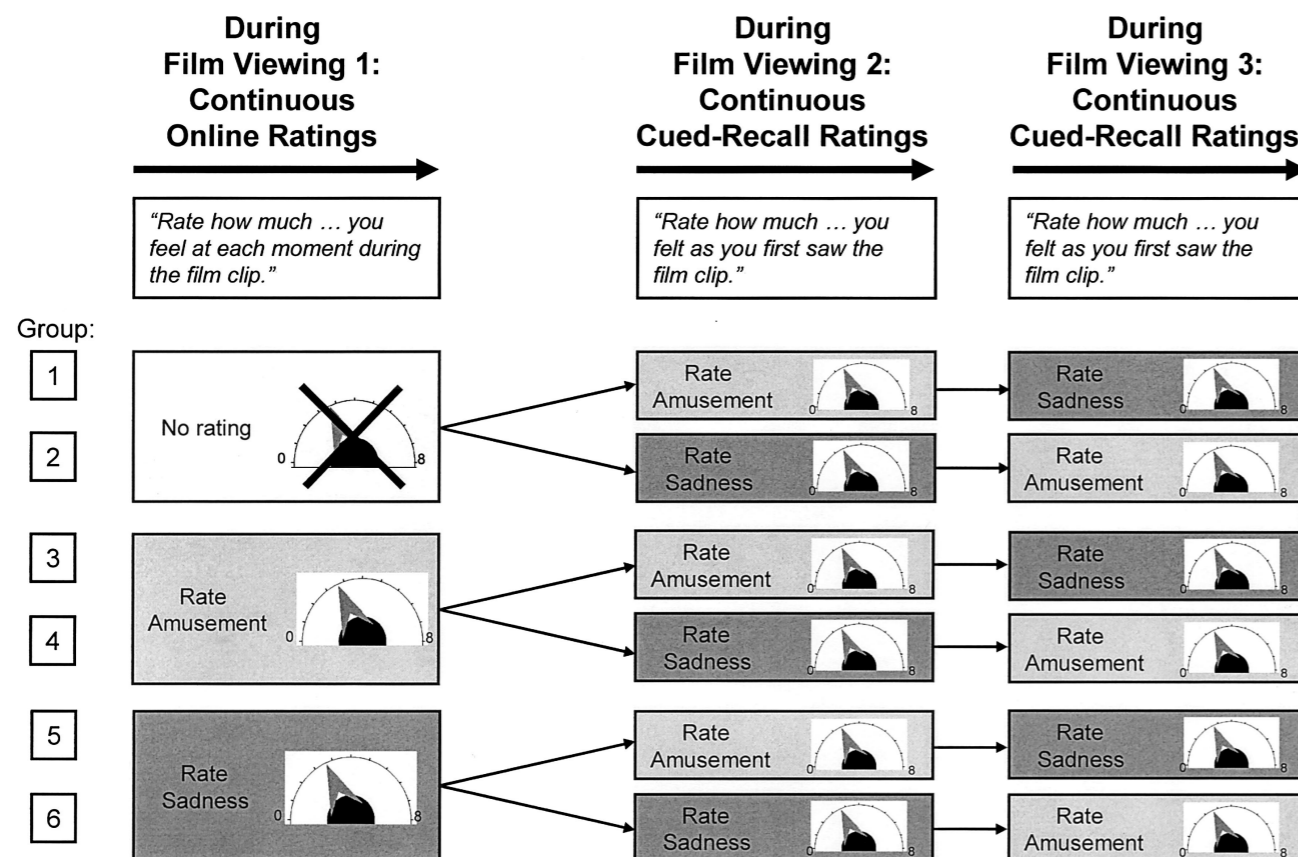
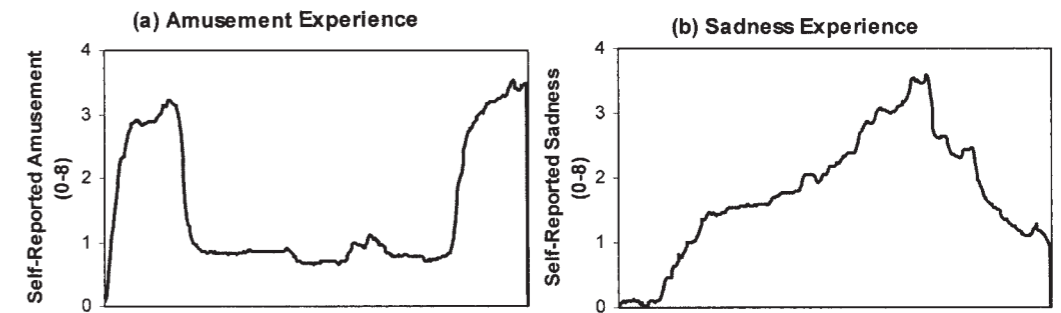
- ▶ Weak correlations between experience, facial expression & physiology



Mauss et al., 2005; Cacioppo et al., 2010

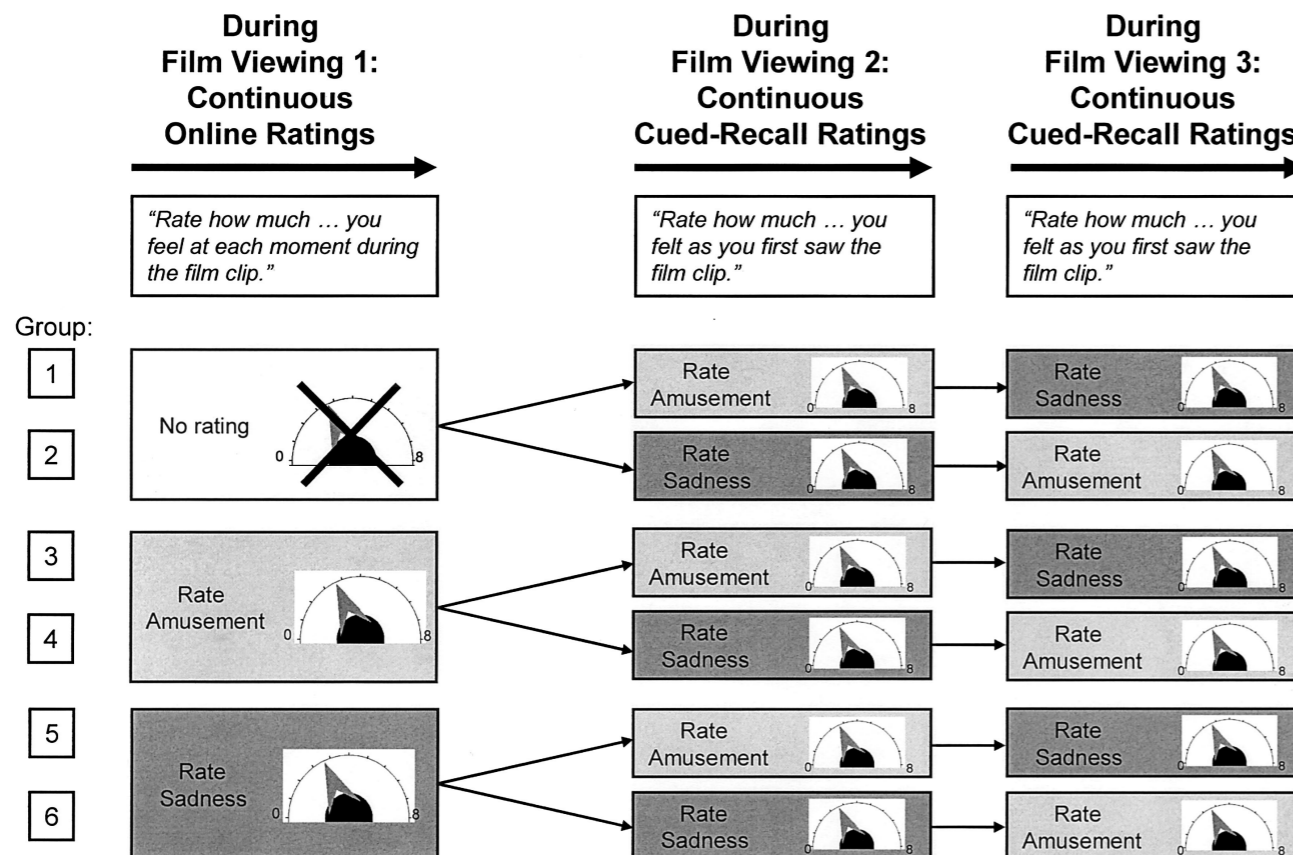
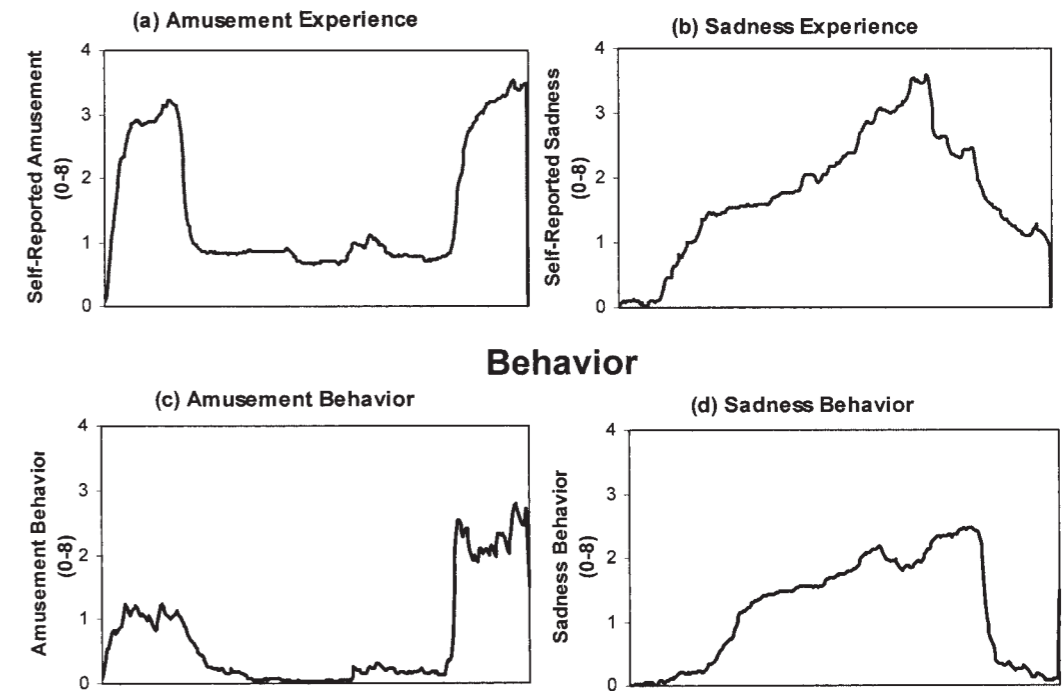
Physiological correlates?

- ▶ Weak correlations between experience, facial expression & physiology



Mauss et al., 2005; Cacioppo et al., 2010

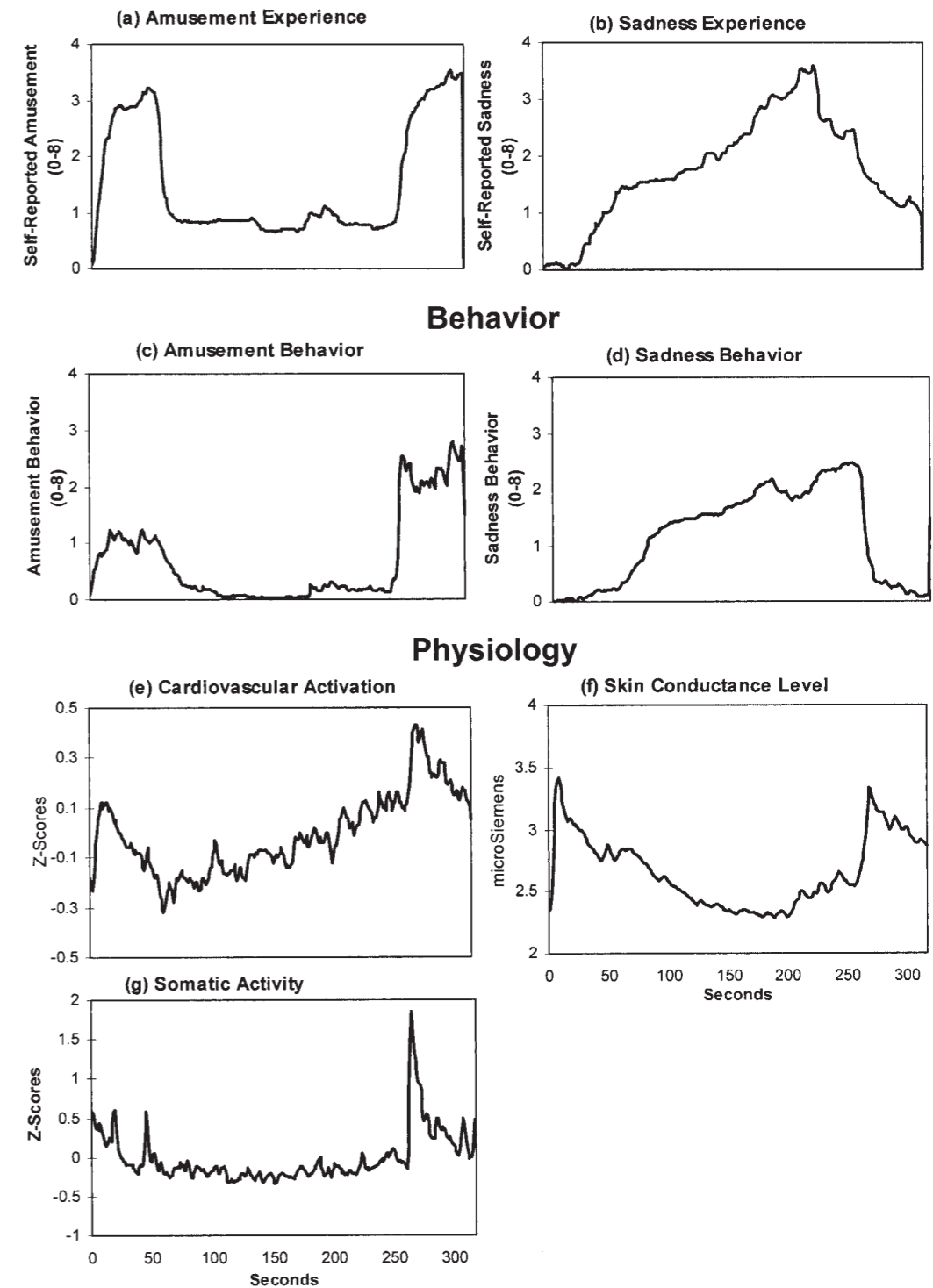
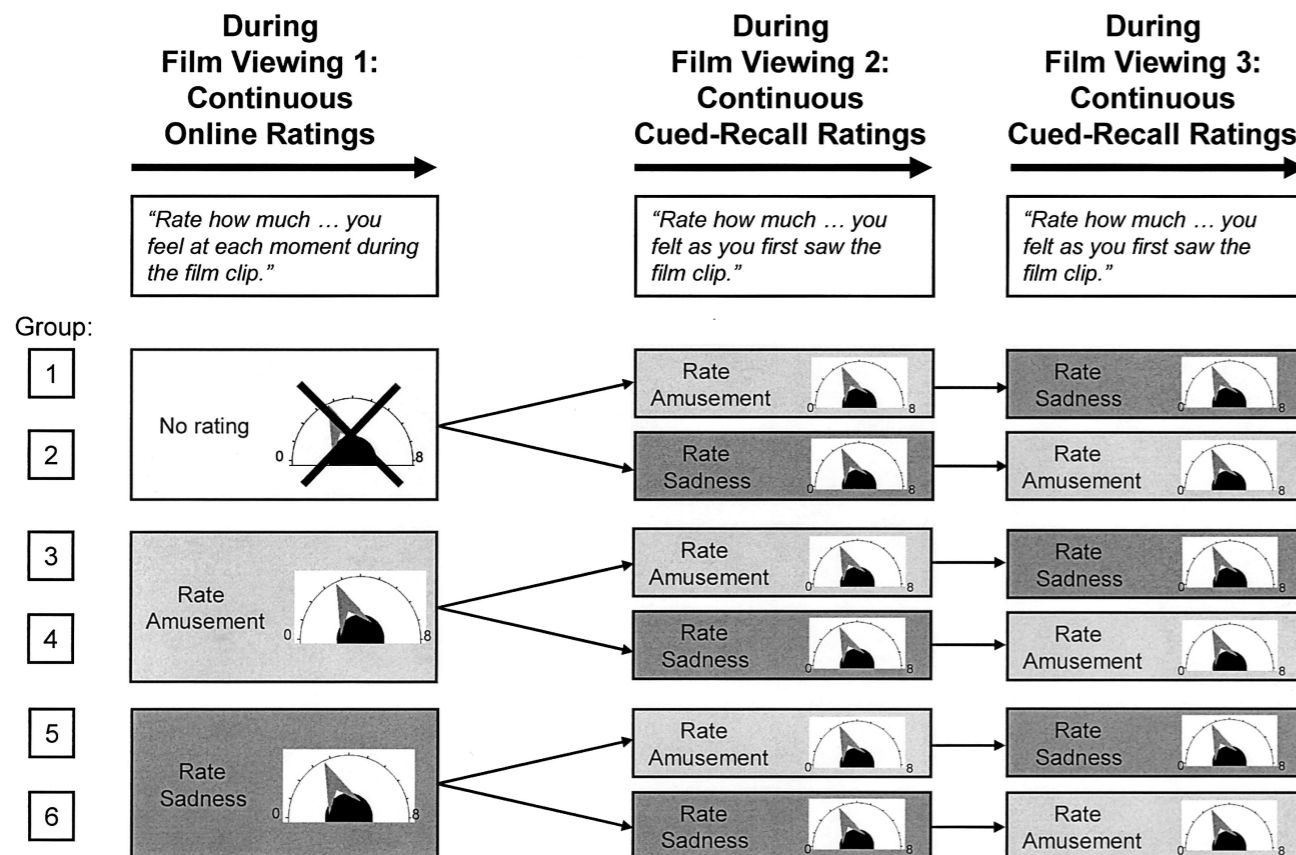
- ▶ Weak correlations between experience, facial expression & physiology



Mauss et al., 2005; Cacioppo et al., 2010

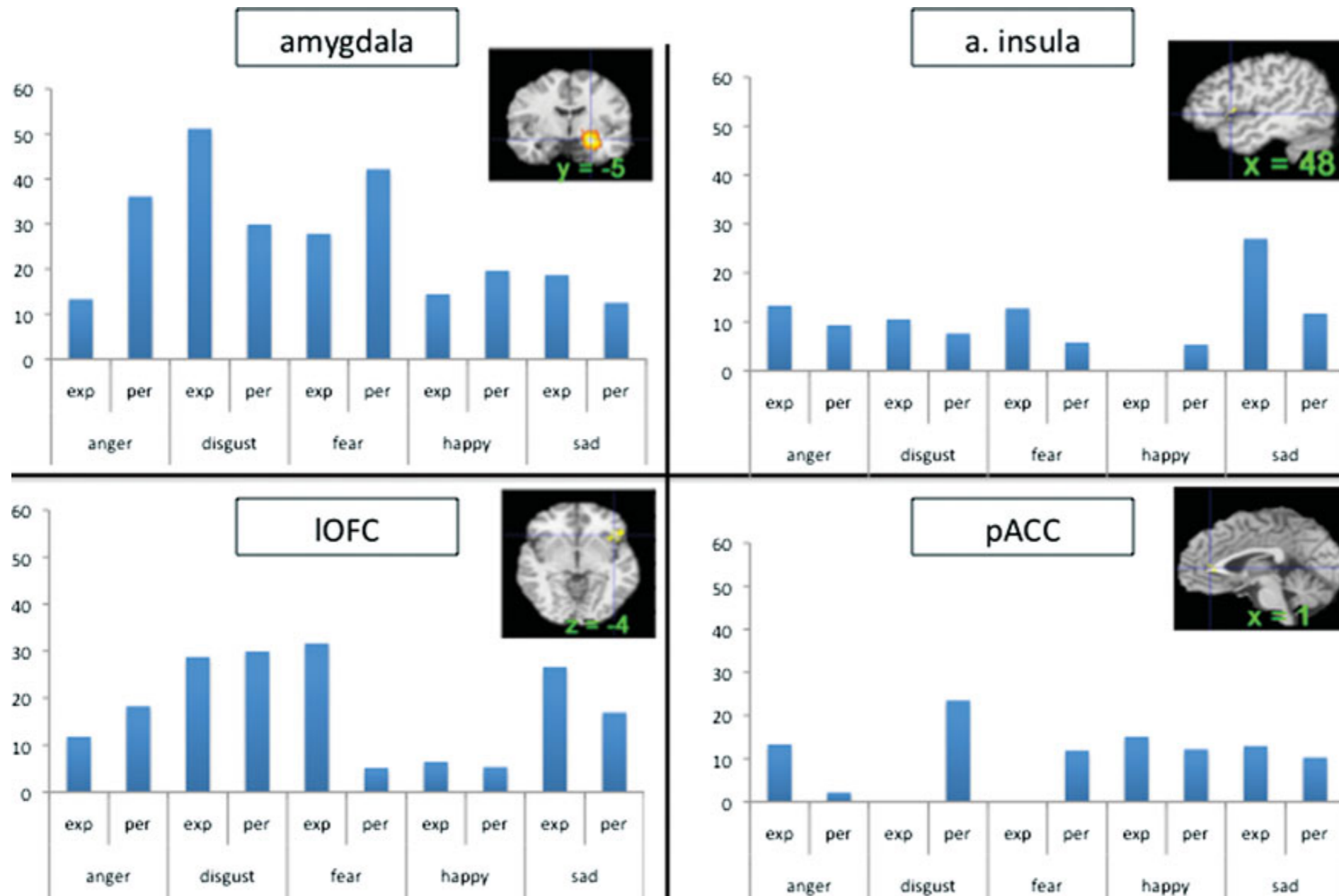
Physiological correlates?

- ▶ Weak correlations between experience, facial expression & physiology



Mauss et al., 2005; Cacioppo et al., 2010

Are there specific neural circuits for UCL



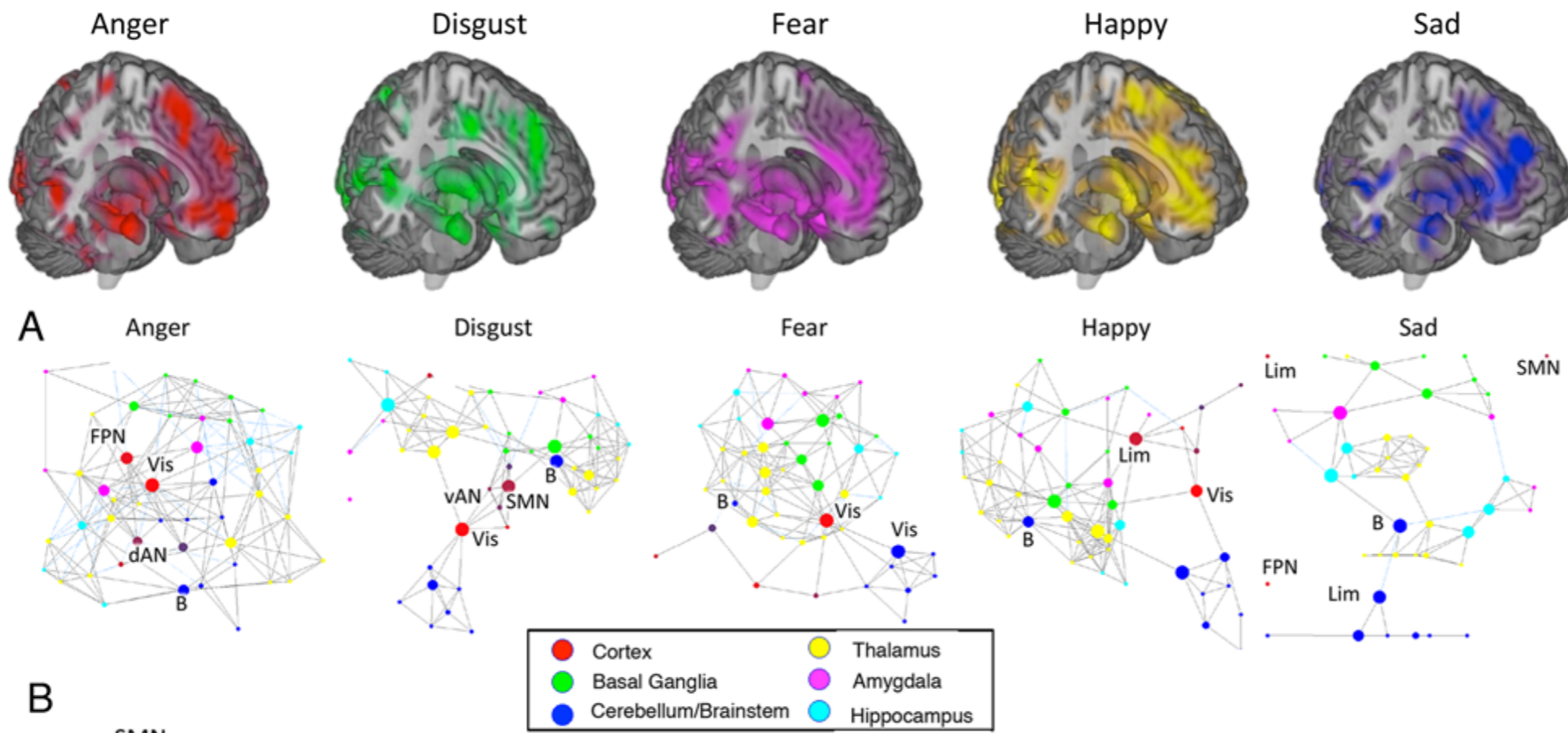
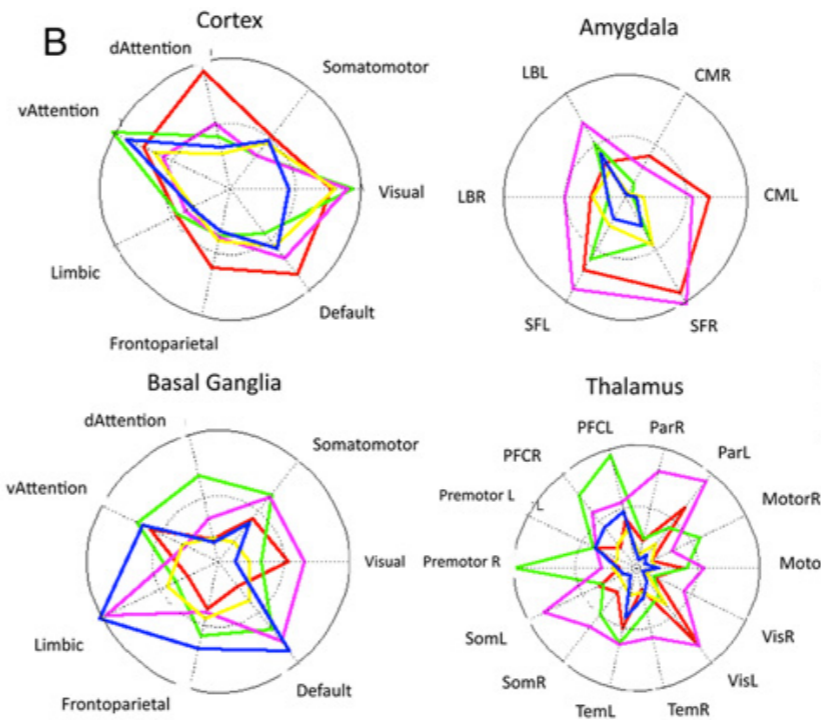
Linquist et al., 2012 Behavioral and Brain Sciences

Can specific emotions be decoded?

B CLASSIFICATION ACCURACY

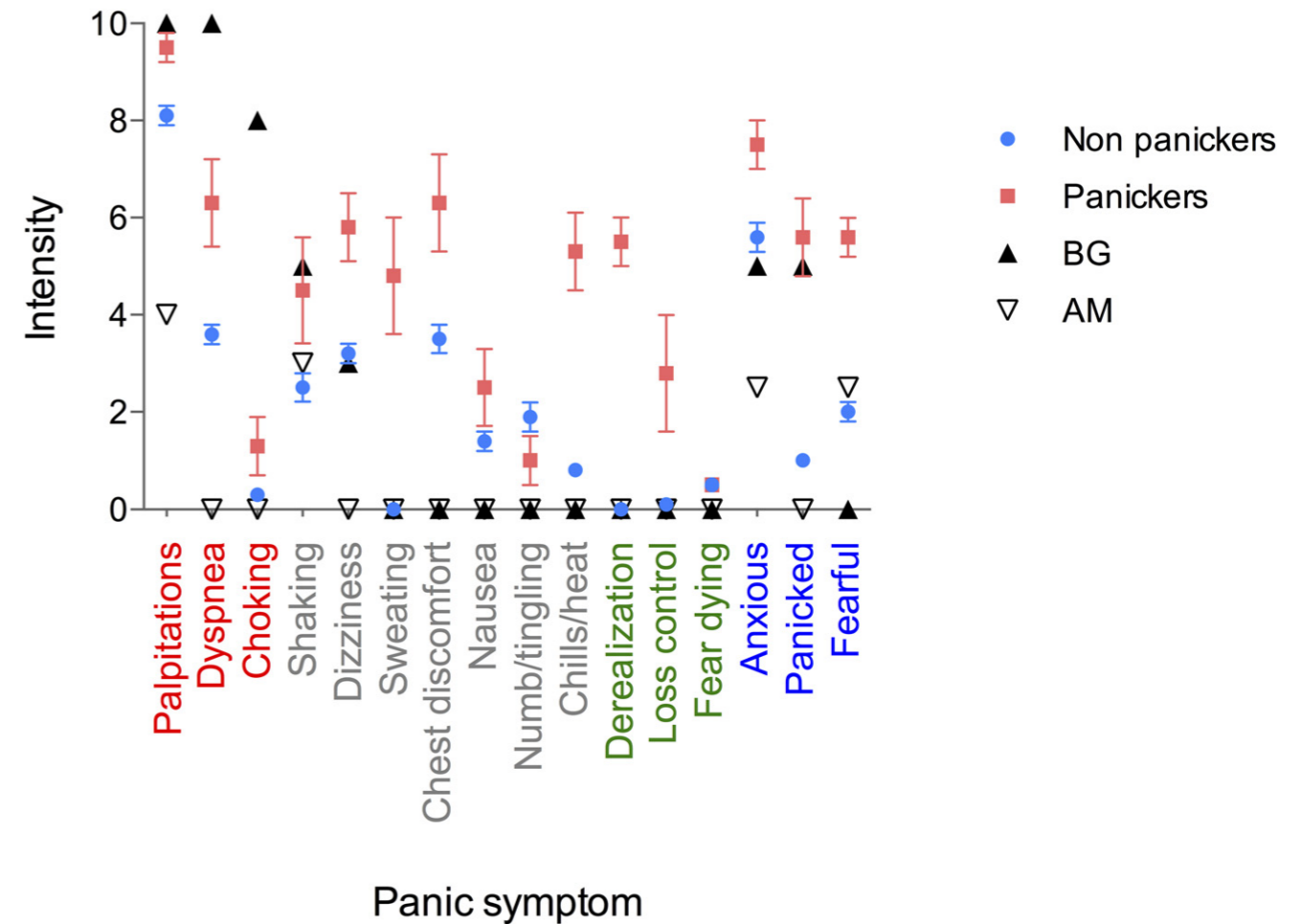
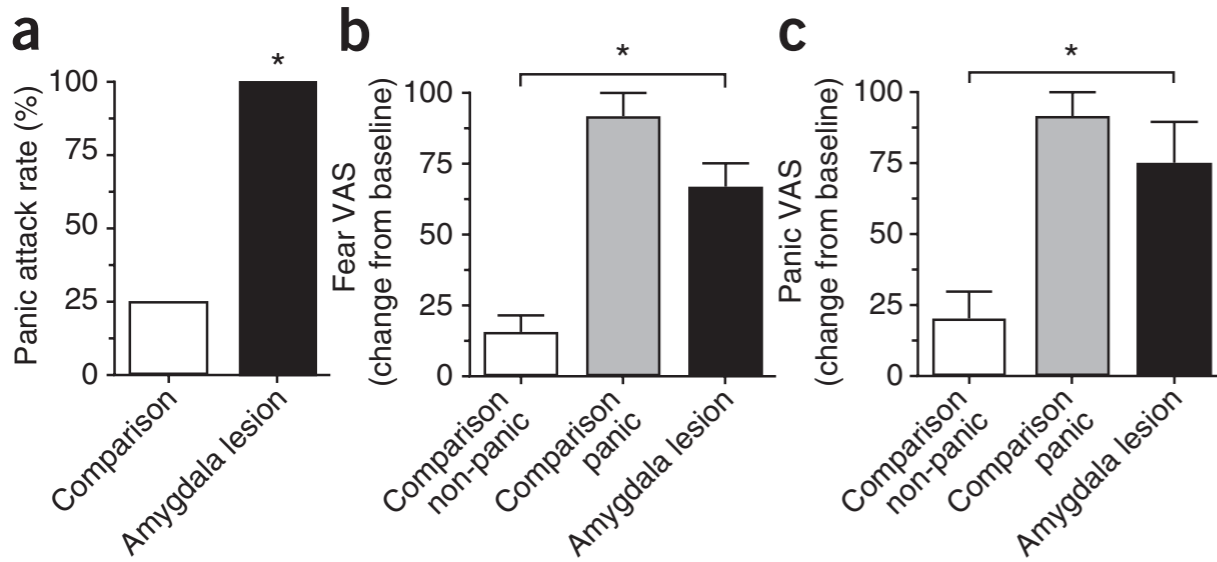
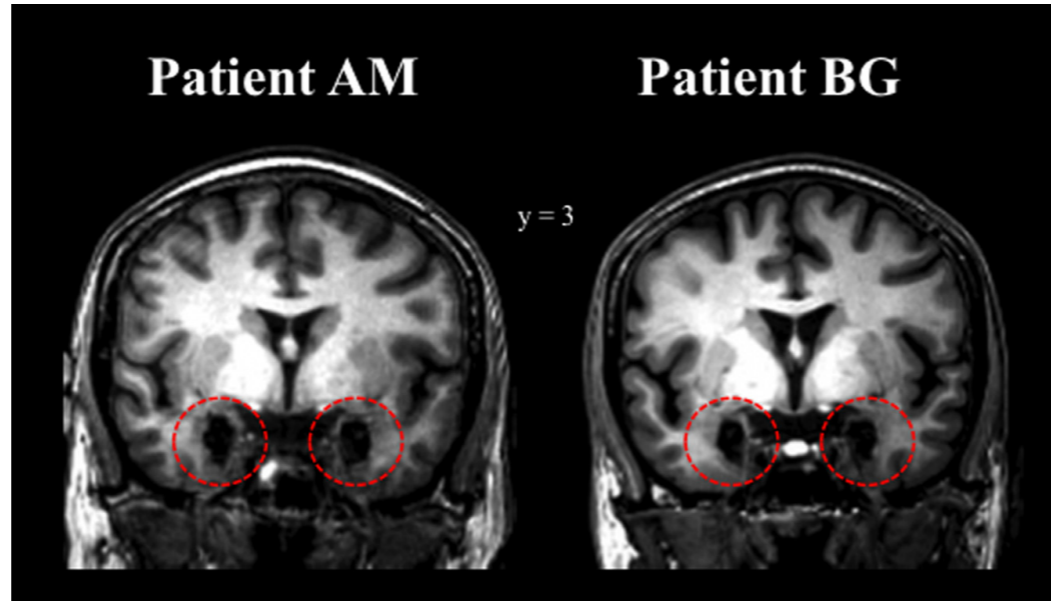
True class	Anger	Disgust	Fear	Happy	Sad
Anger	0.43	0.07	0.28	0.15	0.08
Disgust	0.03	0.76	0.08	0.08	0.06
Fear	0.02	0.04	0.86	0.06	0.03
Happy	0.00	0.07	0.23	0.58	0.11
Sad	0.00	0.07	0.20	0.09	0.65

Classification based on brain



Wager et al., 2015 PLoS Comp Biol

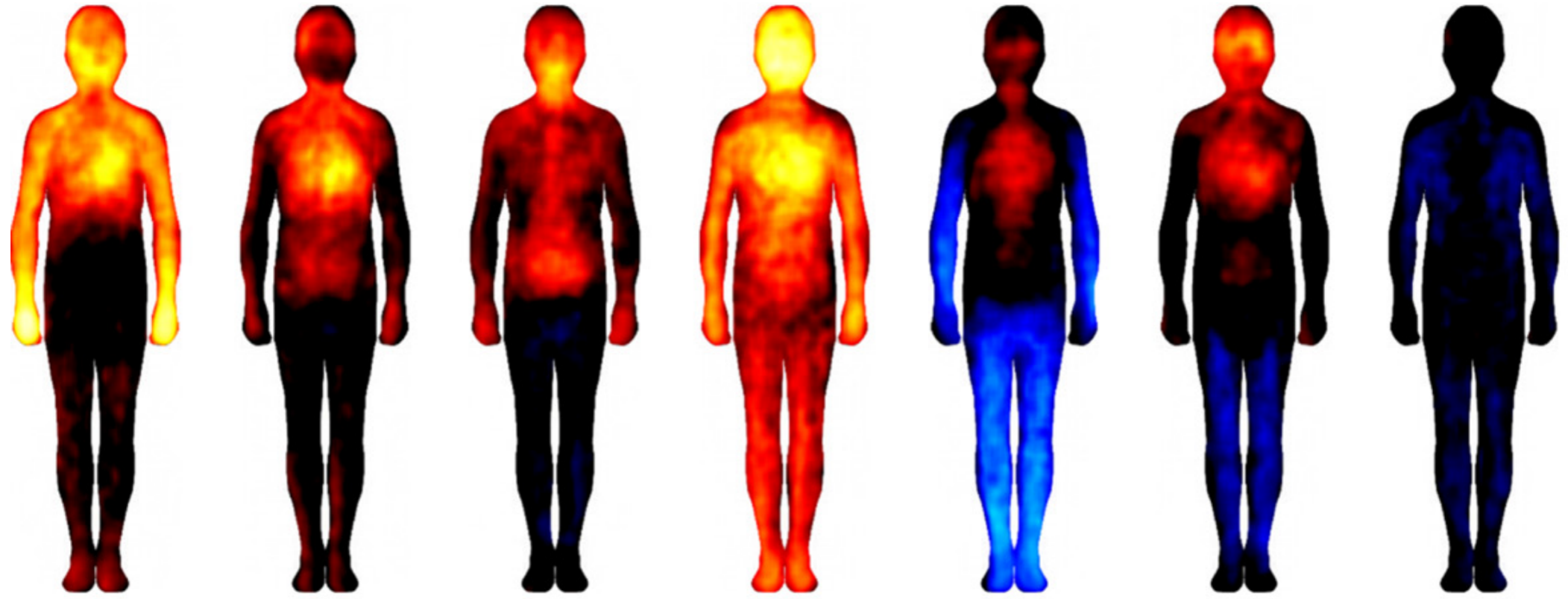
Is the amygdala necessary for fear?



Feinstein et al., 2012 Nat. Neurosci.; Khalsa et al., 2016 J. Neurosci.

- ▶ Discrete emotions as categorisations of internal states





1

2

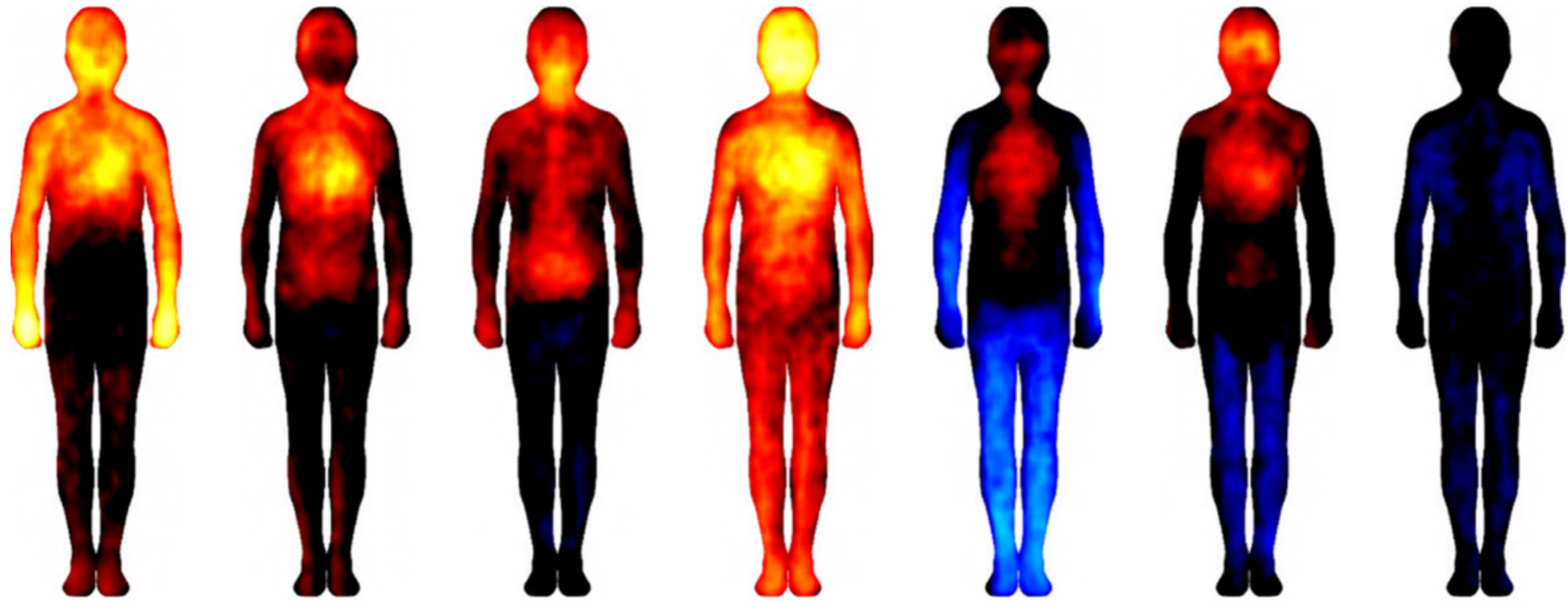
3

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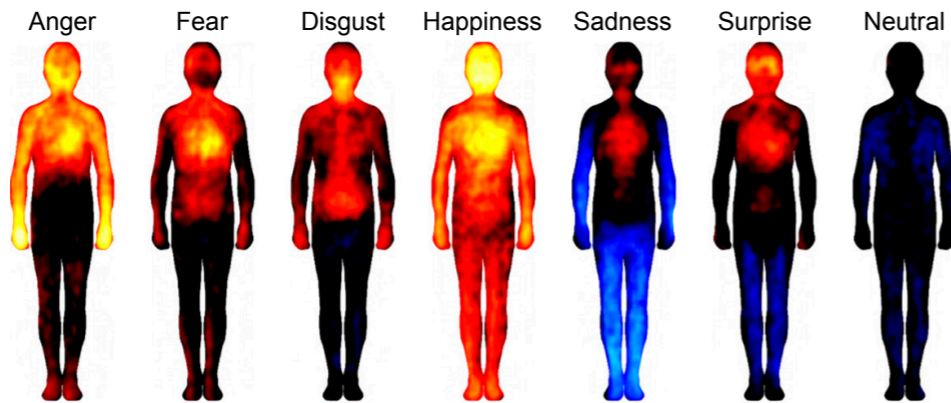
6

7

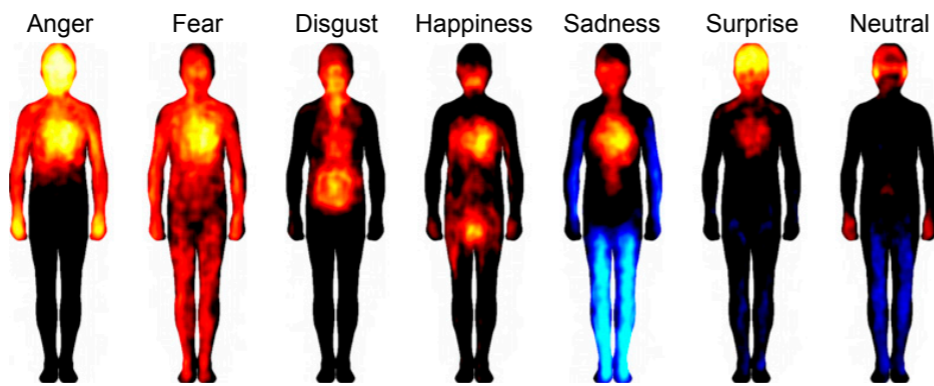
Anger
Disgust
Fear
Happiness
Neutral
Sadness
Surprise

Interoceptive classes?

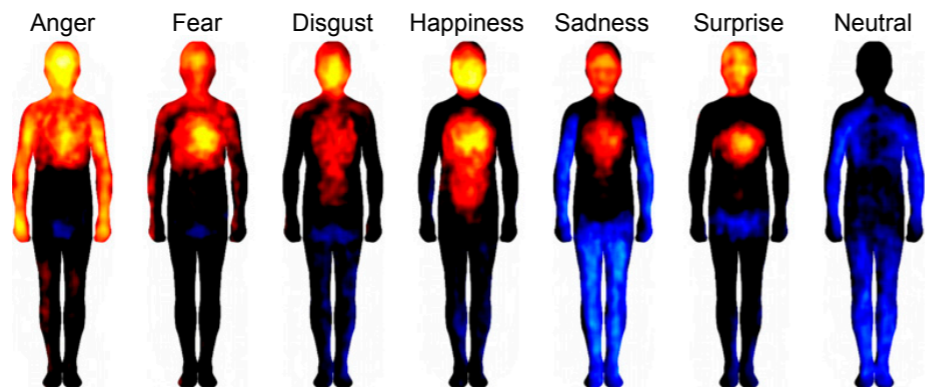
words



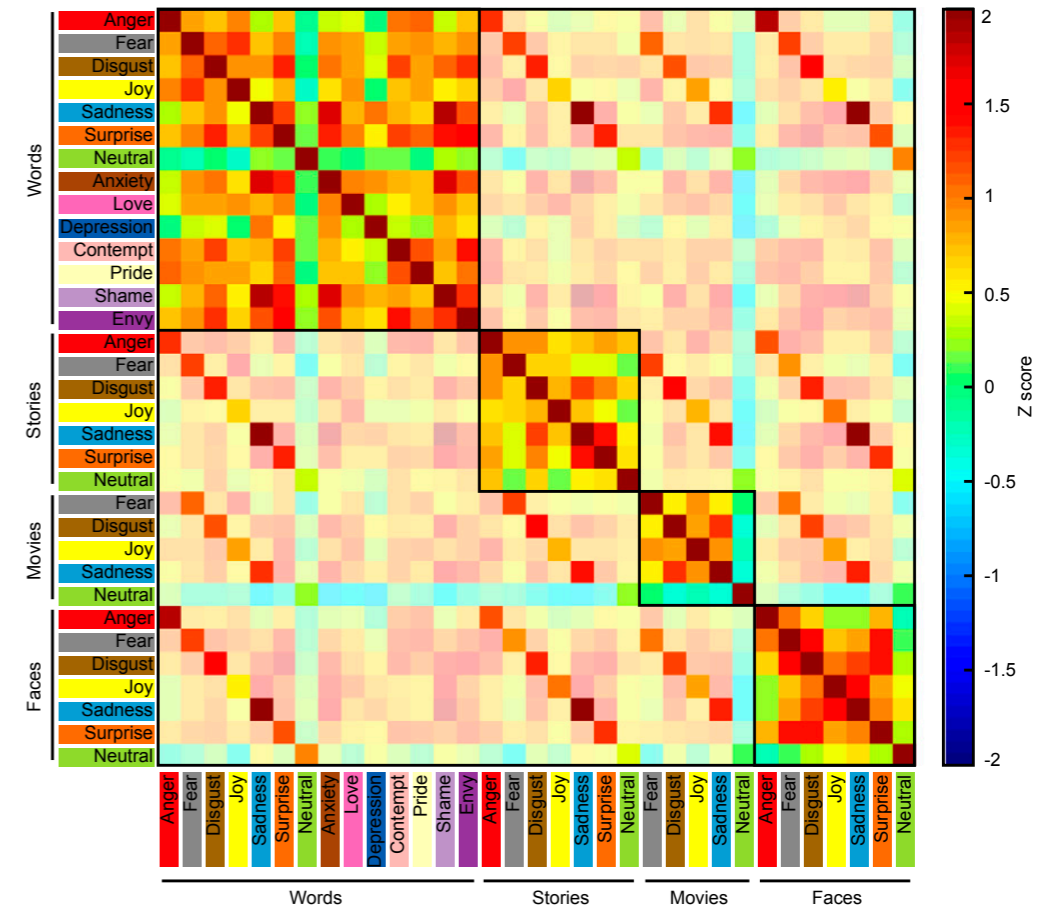
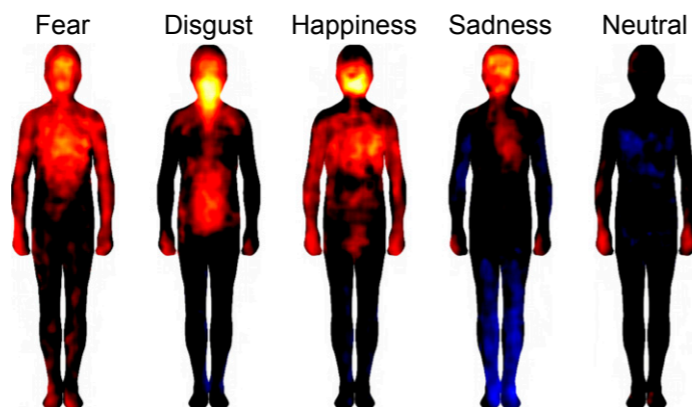
stories



faces

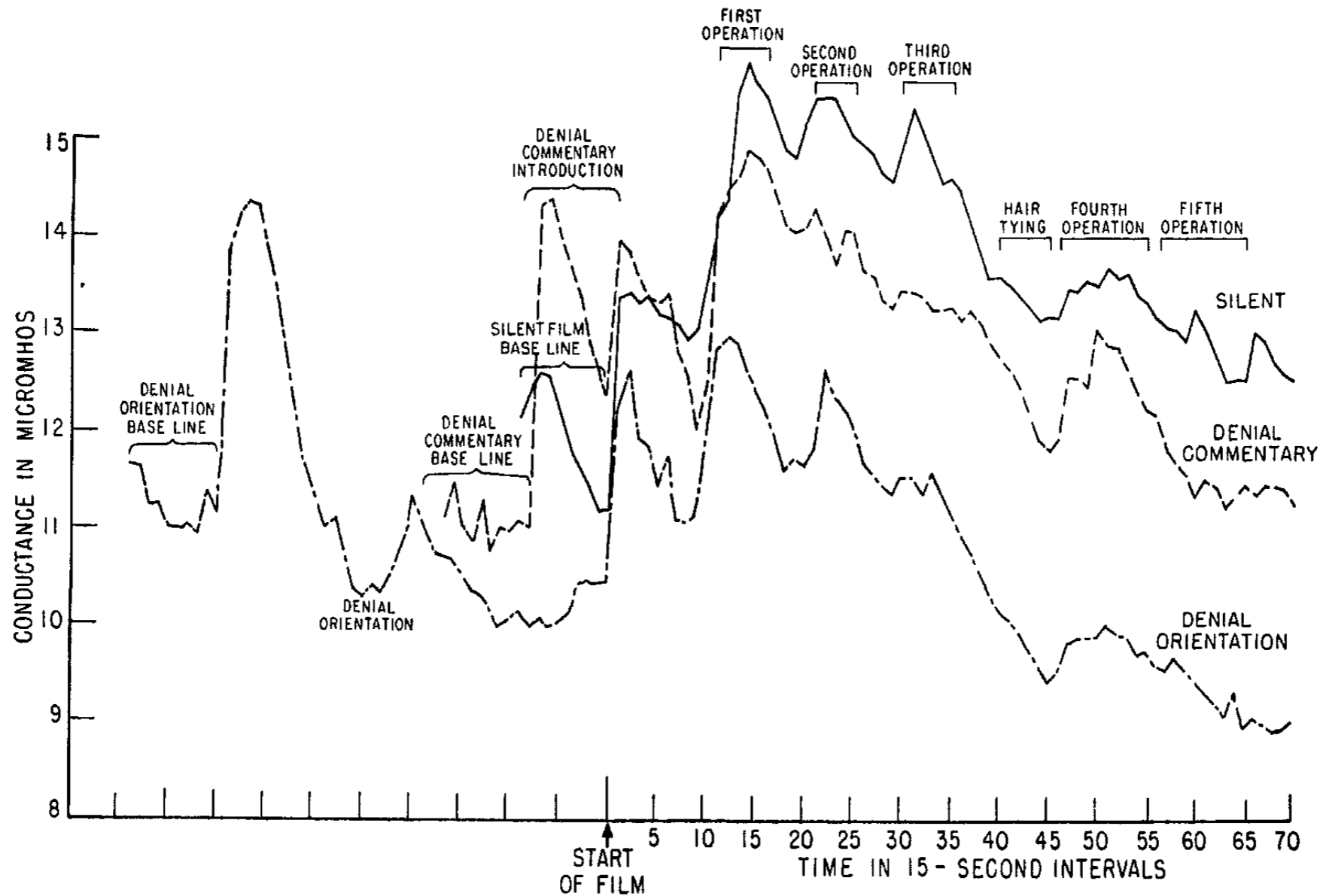


movies



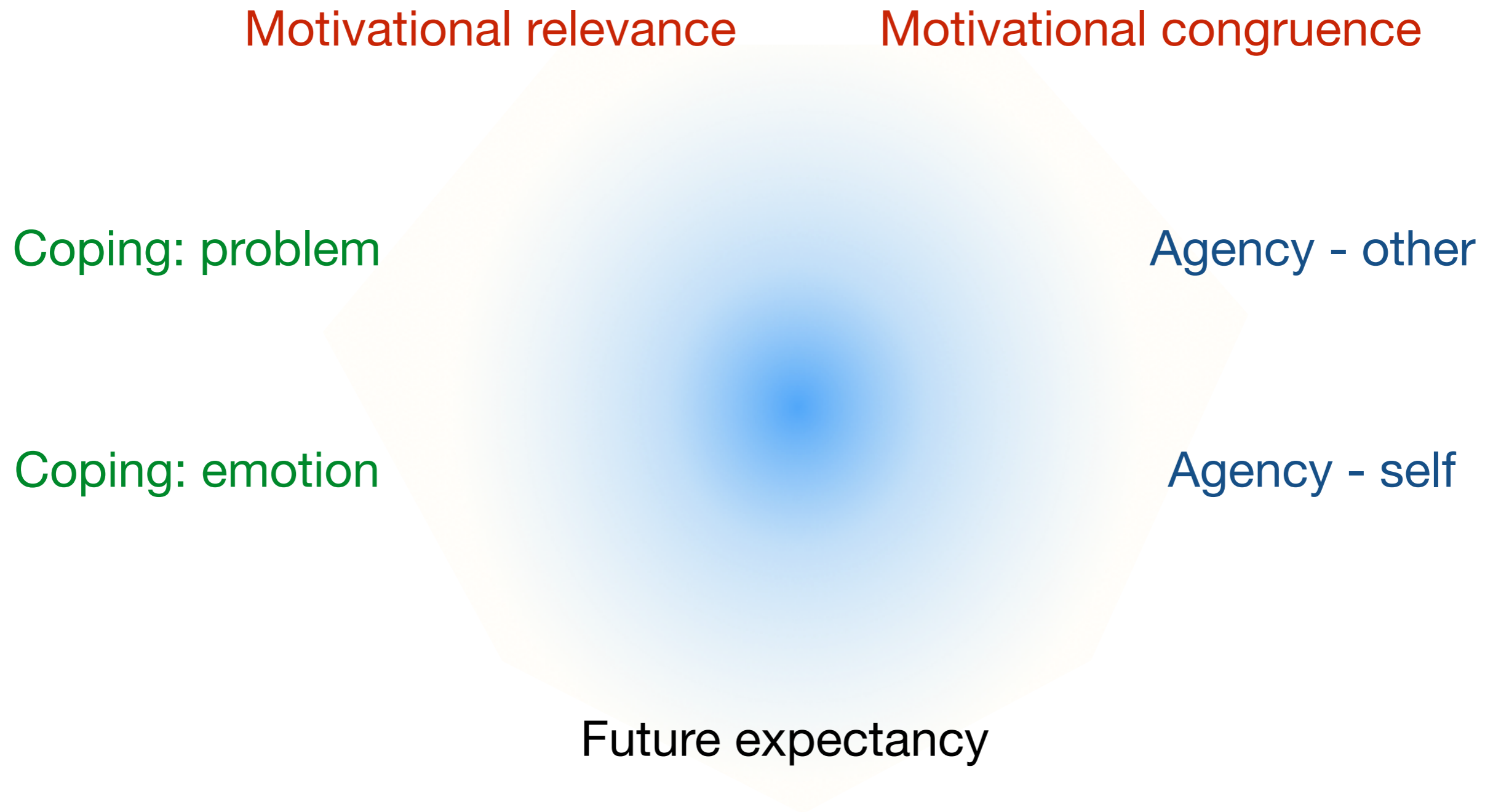
SHORT-CIRCUITING OF THREAT

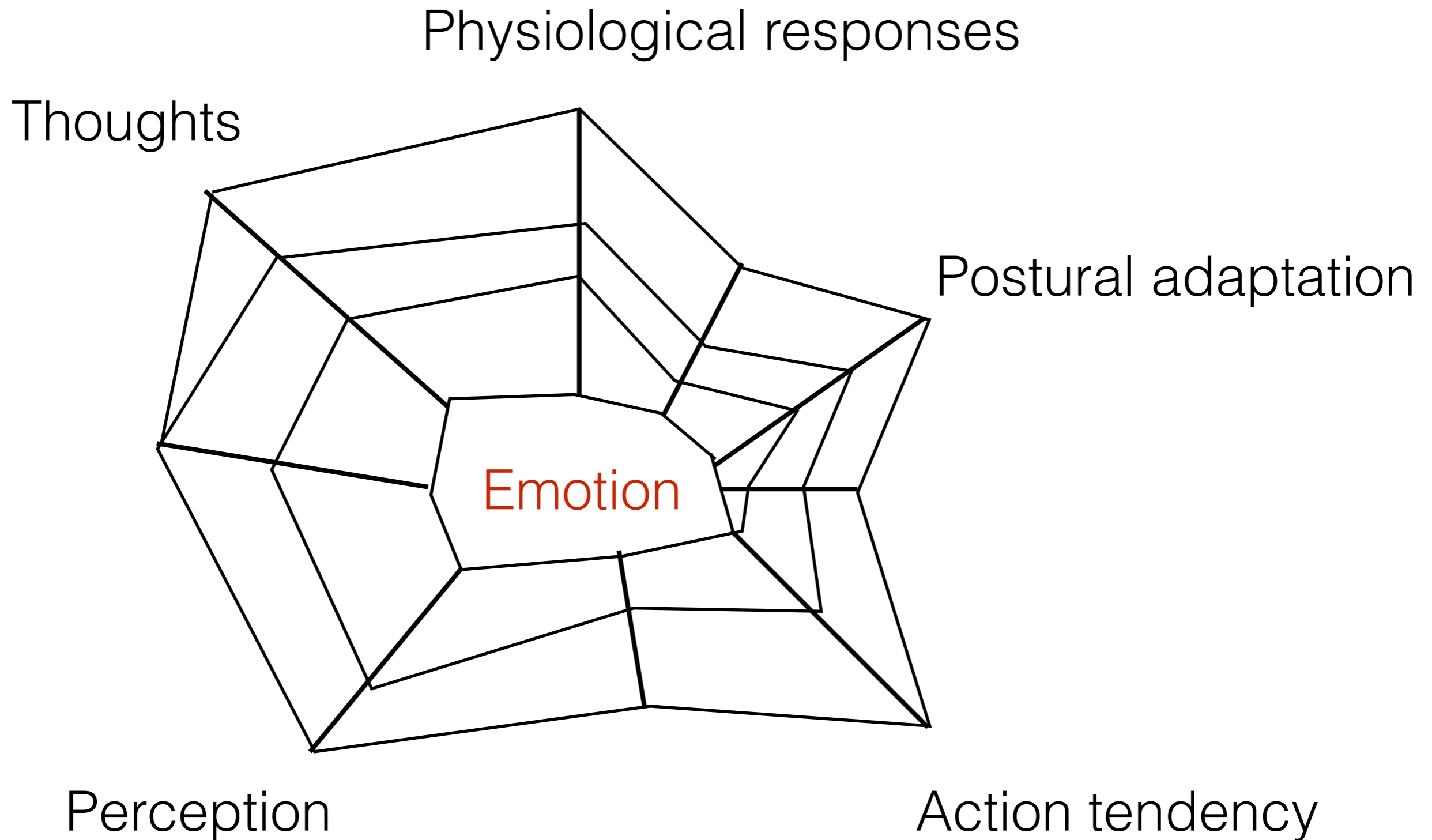
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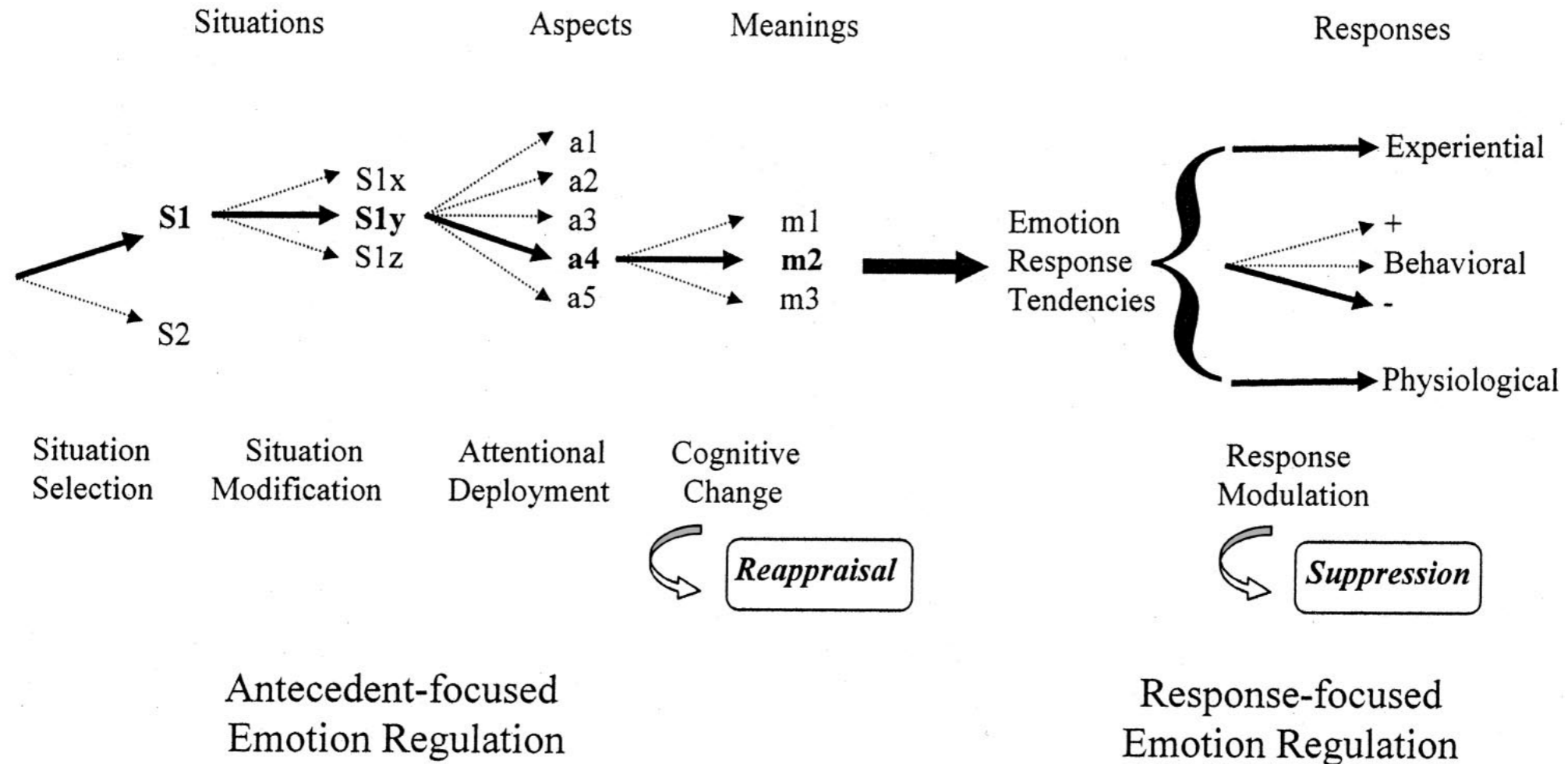


Emotions also strongly affect our thoughts

Lazarus & Alfert 1964







1. I control my emotions by changing the way I think about the situation I'm in.
2. When I want to feel less negative emotion, I change the way I'm thinking about the situation.
3. When I want to feel more positive emotion, I change the way I'm thinking about the situation.
4. When I want to feel more positive emotion (such as joy or amusement), I change what I'm thinking about.
5. When I want to feel less negative emotion (such as sadness or anger), I change what I'm thinking about.
6. When I'm faced with a stressful situation, I make myself think about it in a way that helps me stay calm.
7. I control my emotions by not expressing them.
8. When I am feeling negative emotions, I make sure not to express them.
9. I keep my emotions to myself.
10. When I am feeling positive emotions, I am careful not to express them.

Reappraisal

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Suppression

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- | | |
|--------------------|--|
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Longer Term Implications of Reappraisal and Suppression for Well-Being (Study 5)

	Emotion regulation strategy	
	Reappraisal	Suppression
Depression ^F		
BDI	-.23*	.25*
CES-D	-.25*	.23*
Zung	-.29*	.27*
Life satisfaction ^E	.30*	-.34*
Self-esteem ^E	.30*	-.39*
Optimism ^C	.25*	-.25*
Well-being ^F		
Environmental mastery	.41*	-.23*
Autonomy	.29*	-.22*
Personal growth	.27*	-.28*
Purpose in life	.25*	-.34*
Self-acceptance	.35*	-.38*
Positive relations with others	.23*	-.46*

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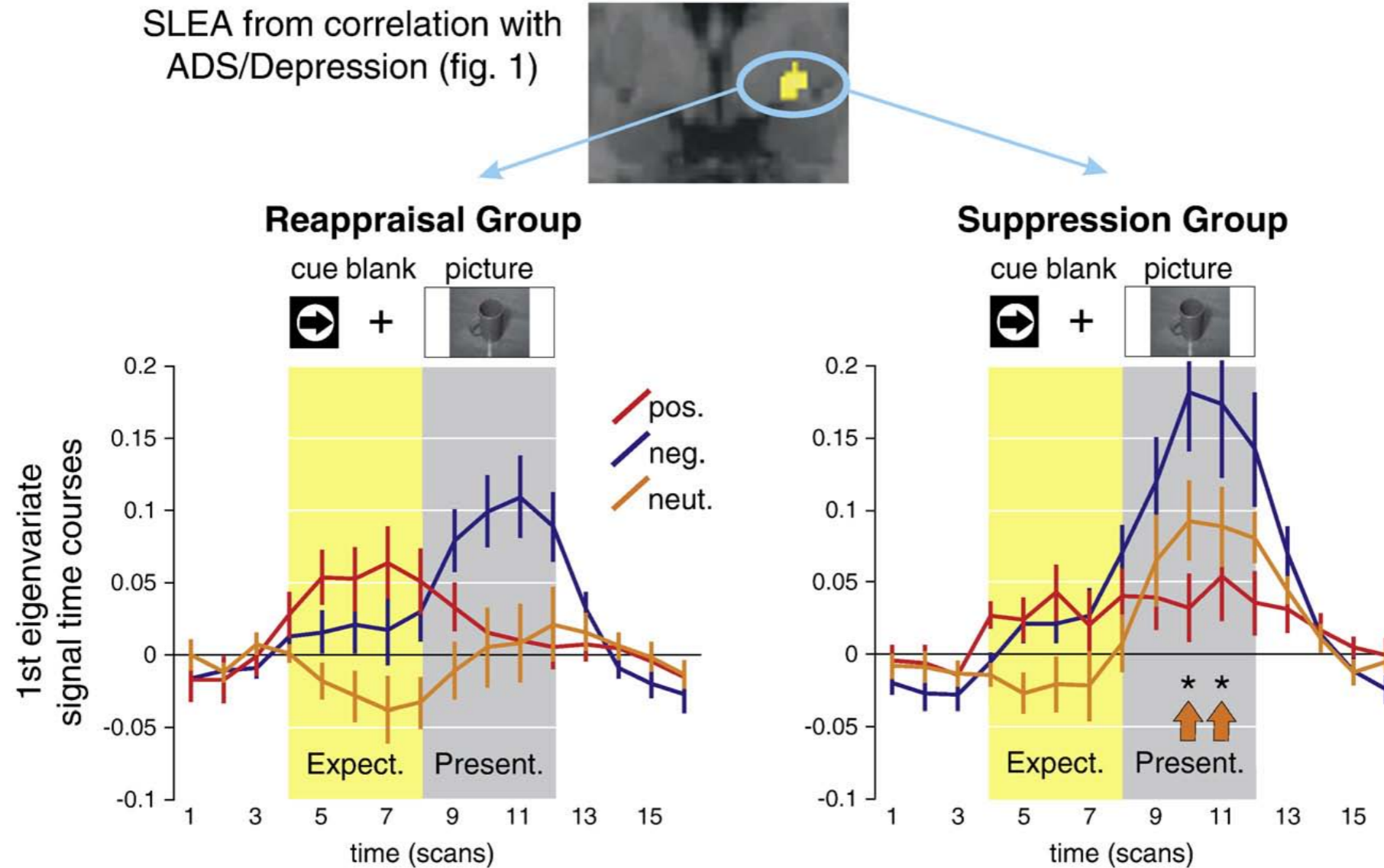
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Big Five personality dimensions^A

Neuroticism	-.20*	.03
Extraversion	.11*	-.41*
Openness	.15*	-.18*
Agreeableness	.14*	-.11*
Conscientiousness	.13*	-.14*

- ▶ Habitual suppression vs reappraisal - alters amygdala reactivity to aversive IAPS images



Abler et al., 2010

Watch your thoughts, for they become words.
Watch your words, for they become actions.
Watch your actions, for they become habits.
Watch your habits, for they become your character.
Watch your character, for it becomes your destiny.

- ▶ Treat as “complex actions”
 - Basic emotion view
 - Action tendencies are important
 - Most prominent approach
 - Inflexibility -> Pavlovian account

$$p(a; s) \propto Q(a, s)$$

$$p(a(c(s))) \propto V(s)$$



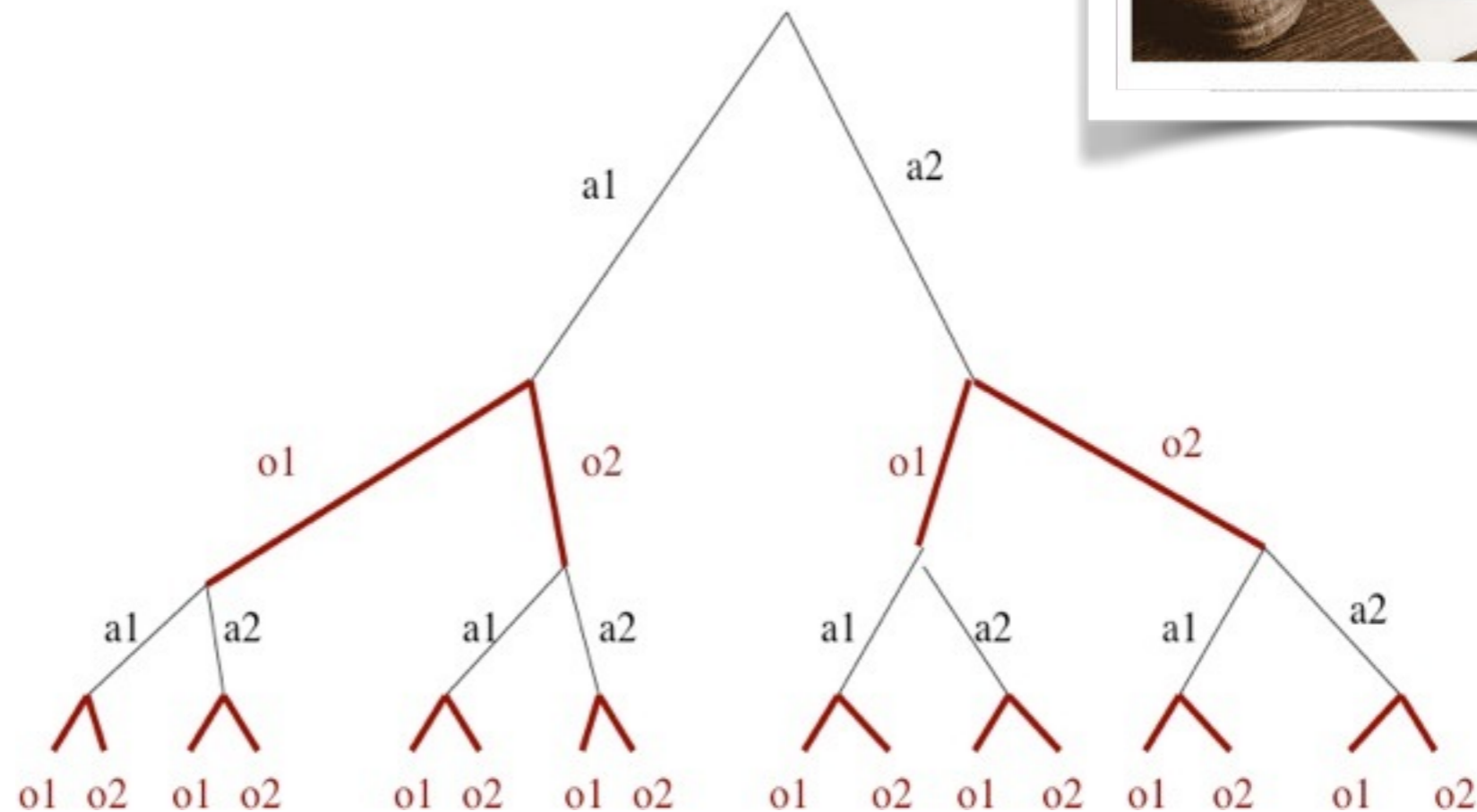
► Treat as “complex actions”

- Basic emotion view
- Action tendencies are important
- Most prominent approach
- Inflexibility \rightarrow Problem

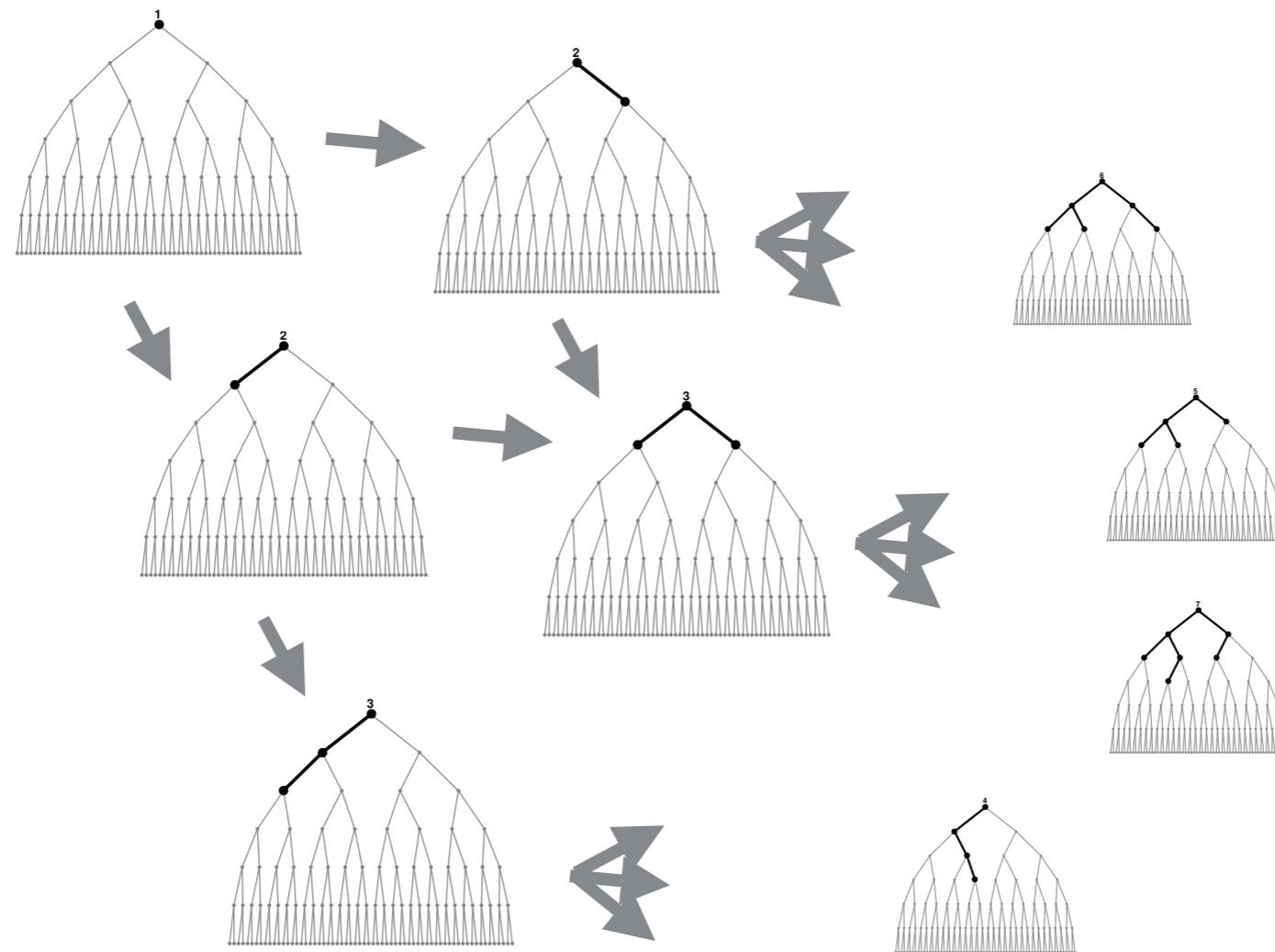
$$p(a; s) > p(a(c(s)))$$



- Each move: 30 odd options
- 30^{40} ?
- Legal boards $\sim 10^{123}$
- Can't just do full tree search.



- ▶ Resource constraints induce further problem
- ▶ Optimally deploying resources

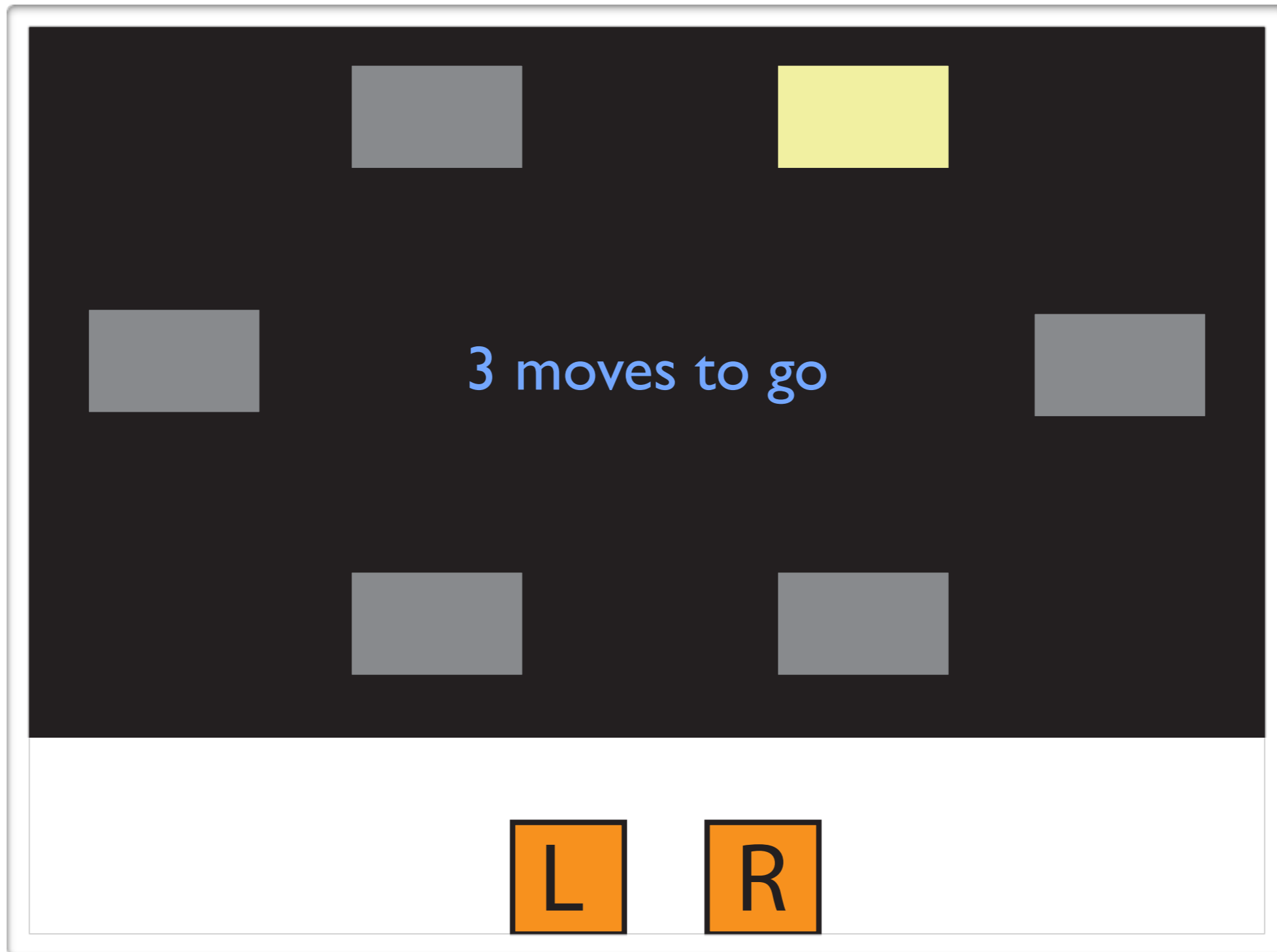


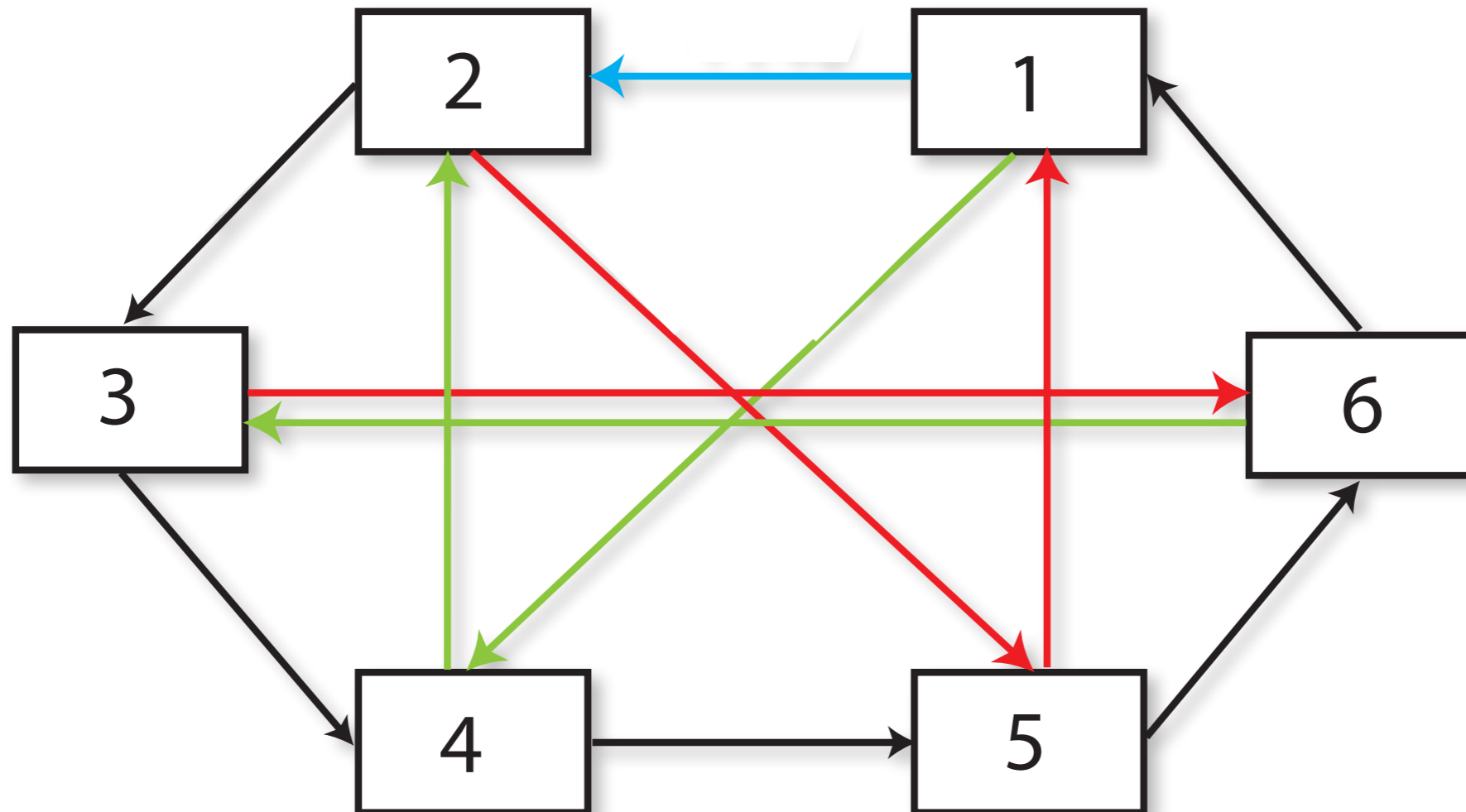
- ▶ Resource constraints induce further problem
- ▶ Optimally deploying resources

$$\begin{aligned} Q(s, a) &= \sum_{s'} \mathcal{T}(s' | s, a) [\mathcal{R}(s', a, s) + \mathcal{V}(s')] \\ &= b_{s,a} \end{aligned}$$

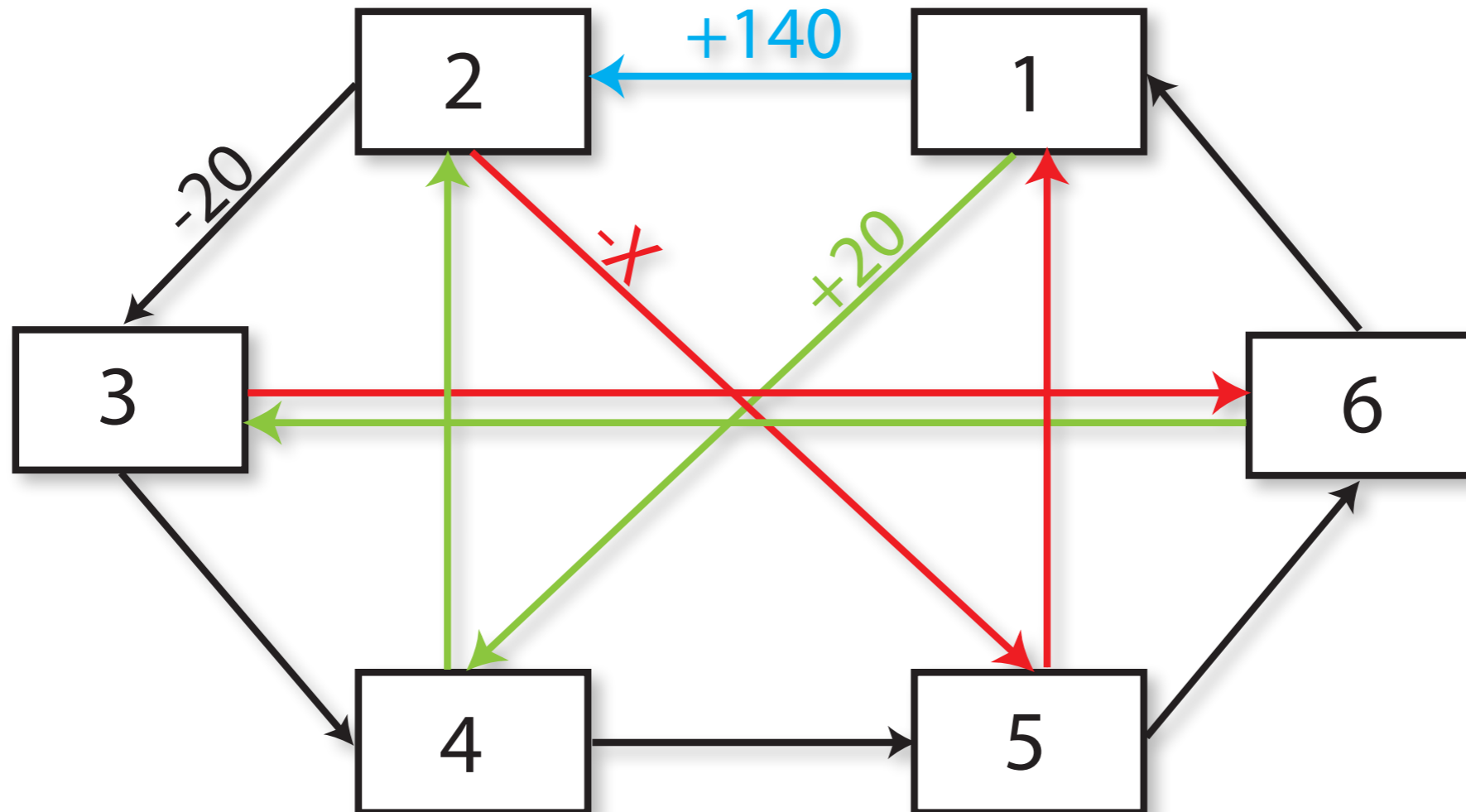
$$Q(b, c) = \sum_{b'} \mathcal{T}(b' | b, c) [\mathcal{R}(b', c, b) + \mathcal{V}(b')]$$

- ▶ Entirely intractable
- ▶ Approximations are **mandatory**

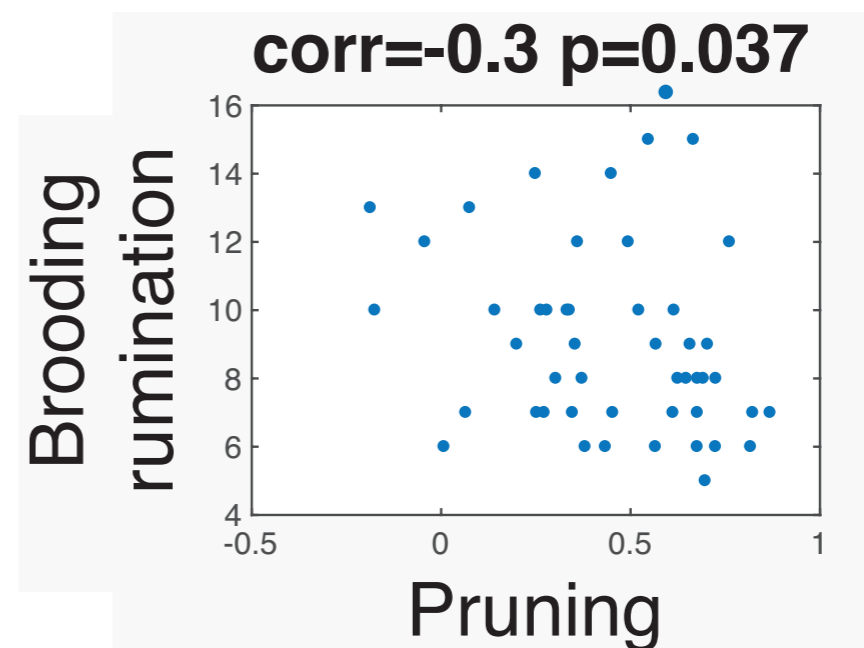
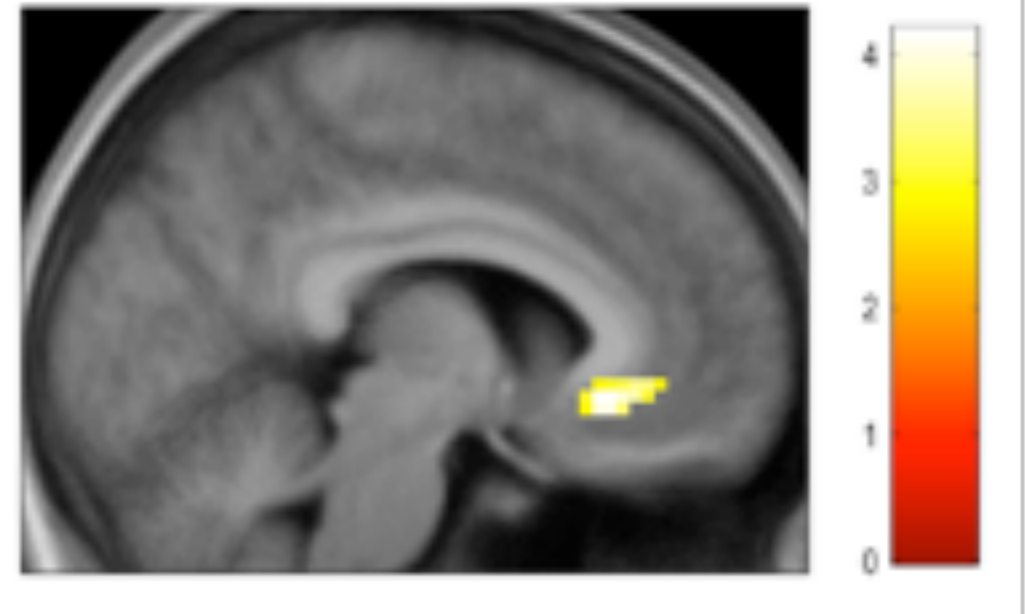
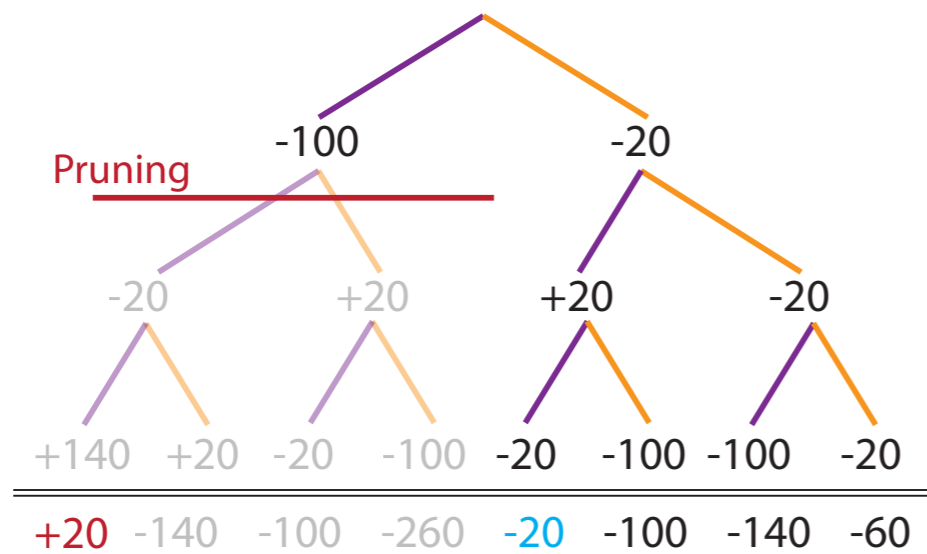




A tree search task



A tree search task



Lally et al., 2018, J. Neurosci; Huys et al., in prep.

- ▶ Basic emotions
 - Innate response strategies to evolutionarily important situations
 - Fail some critical tests
- ▶ Appraisal theories
 - Humans vary hugely in emotional responses
 - Depends on interpretation
 - Reappraisal, emotion regulation
 - Triggers... basic emotion
- ▶ Constructionist theories
- ▶ Decision-making: metareasoning

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- ▶ Innate behaviours in humans
- ▶ Are emotions Pavlovian responses?
 - Theories of emotions
- ▶ Disorders of emotion

- ▶ depressed mood
 - ▶ anhedonia
 - ▶ hypersomnia / insomnia
 - ▶ weight gain / weight loss
 - ▶ psychomotor retardation
 - ▶ fatigue
 - ▶ guilt / worthlessness / helplessness
 - ▶ indecisiveness, concentration difficulties
 - ▶ suicidality
-
- ▶ duration & impairment

TABLE 1. Sensitivity, Specificity, OR, PPV and NPV of Alternative Symptom Criteria for Major Depressive Disorder ($N = 1523$)^a

Symptom	Sensitivity %	Specificity %	OR	PPV %	NPV %
Depressed mood	92.9	82.4	61.2	86.3	90.6
Diminished interest/pleasure	80.6	87.8	29.7	88.7	79.1

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Depressed mood	92.9	82.4	61.2	86.3	90.6
Loss of energy or diminished drive	97.6	55.3	50.1	72.3	95.0
Loss of energy	87.2	68.4	14.8	76.8	81.8
Diminished drive	88.2	69.9	17.3	77.8	83.2
Diminished interest/pleasure or diminished drive	94.2	66.4	32.2	77.0	90.6
Diminished interest/pleasure	80.6	87.8	29.7	88.7	79.1

Table 5

Prevalences of lifetime interference, help seeking, and use of medication for minor depression and major depression

	Interference ^a		Saw MD ^a		Saw other ^a		Took medication ^a		Any of the four		(n)
	%	(S.E.)	%	(S.E.)	%	(S.E.)	%	(S.E.)	%	(S.E.)	
Minor depression	18.1	(1.1)	24.5	(1.3)	12.1	(1.0)	10.0	(0.9)	42.0	(1.5)	(810)
Major depression 5–6	29.7 ^b	(1.4)	27.8	(1.4)	18.0 ^b	(1.2)	15.8 ^b	(1.1)	49.7 ^b	(1.5)	(664)
Major depression 7–9	52.3 ^b	(1.7)	35.3 ^b	(1.6)	21.5 ^b	(1.4)	20.3 ^b	(1.4)	68.2 ^b	(1.6)	(606)

Average (mean) number of 30-day work loss and work cutback days associated with 12-month minor depression and major depression

	Employed					Homemakers				
	Work loss days		Work cutback days		(n)	Work loss days		Work cutback days		(n)
	\bar{x}	(S.E.)	\bar{x}	(S.E.)		\bar{x}	(S.E.)	\bar{x}	(S.E.)	
Minor depression	0.17	(0.11)	0.79	(0.23)	(242)	0.10	(0.10)	1.15	(0.78)	(40)
Major depression 5–6	0.17	(0.04)	0.99	(0.20)	(227)	0.36	(0.35)	1.20	(0.46)	(30)
Major depression 7–9	0.48 ^a	(0.13)	2.75 ^a	(0.34)	(222)	1.70 ^a	(0.59)	4.27 ^a	(1.08)	(49)

Table 5.—Adjusted and Unadjusted Attributable Risks for First-Onset Major Depression at Wave II

Psychiatric Disorder	Unadjusted Attributable Risk	Adjusted Attributable Risk
Dysthymia	0.050	0.077
Panic disorder	0.039	0.007
Somatization	0.017	0.006
Alcohol abuse	0.057	0.020
Other drug abuse	0.030	0.000
Obsessive-compulsive disorder	0.049	0.011
Schizophrenia	0.040	0.013
Depressive symptoms	0.581	0.553

Horwath et al., 1992 - ECA

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Table 3

Frequency of Symptom Presentation in the Prodromal and Residual Phases (N = 331 Episodes)

Symptom	Prodromal frequency	Residual frequency
Depressed mood	95	79
Decreased appetite	42	40
Weight loss	13	12
Increased appetite	10	12
Weight gain	20	17
Initial insomnia	29	30
Middle insomnia	13	10
Early waking	11	14
Hypersomnia	23	22
Decreased energy	38	35
Decreased interest or pleasure	82	75
Self-blame	51	55
Decreased concentration	78	75
Indecision	6	8
Suicidality	6	5
Psychomotor agitation	6	5
Psychomotor retardation	10	7
Crying more frequently	34	31
Inability to cry	4	2
Hopelessness	195	201
Worrying/Brooding	104	118
Decreased self-esteem	195	199
Irritability	85	72
Dependency	45	46
Self-pity	24	28
Somatic complaints	5	4
Decreased effectiveness	38	37
Helplessness	35	28
Decreased initiation of voluntary responses	19	23

Iacoviello et al., 2010

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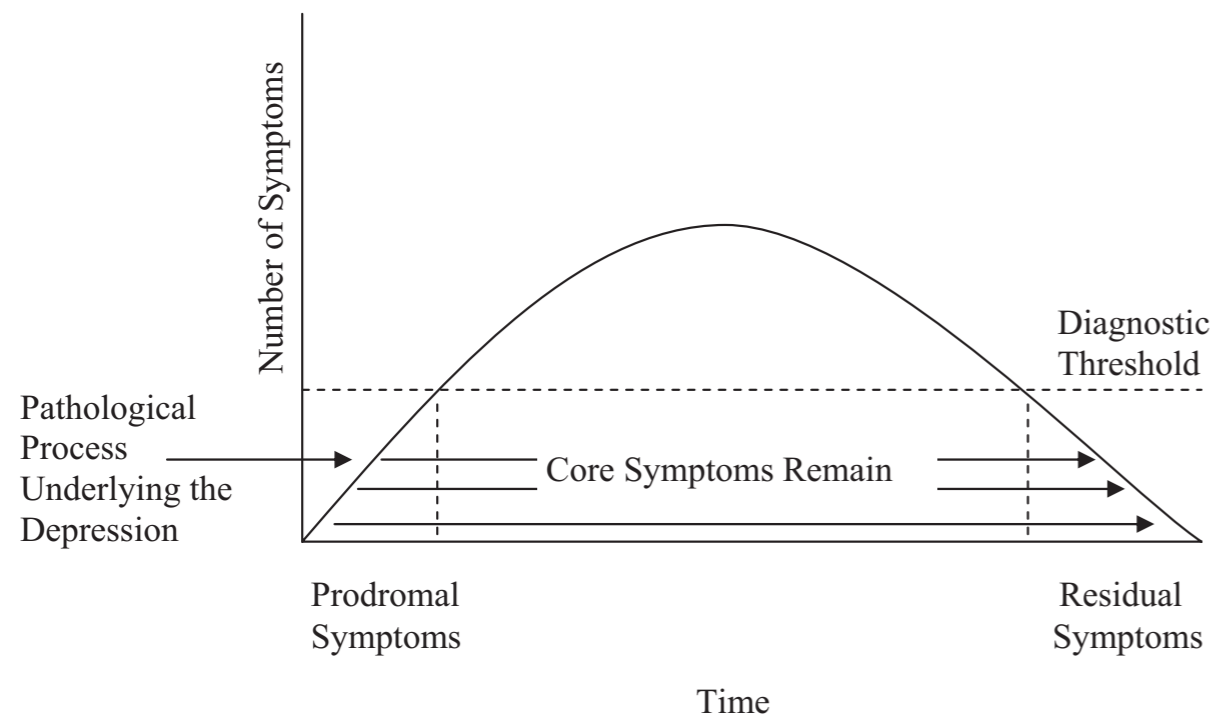


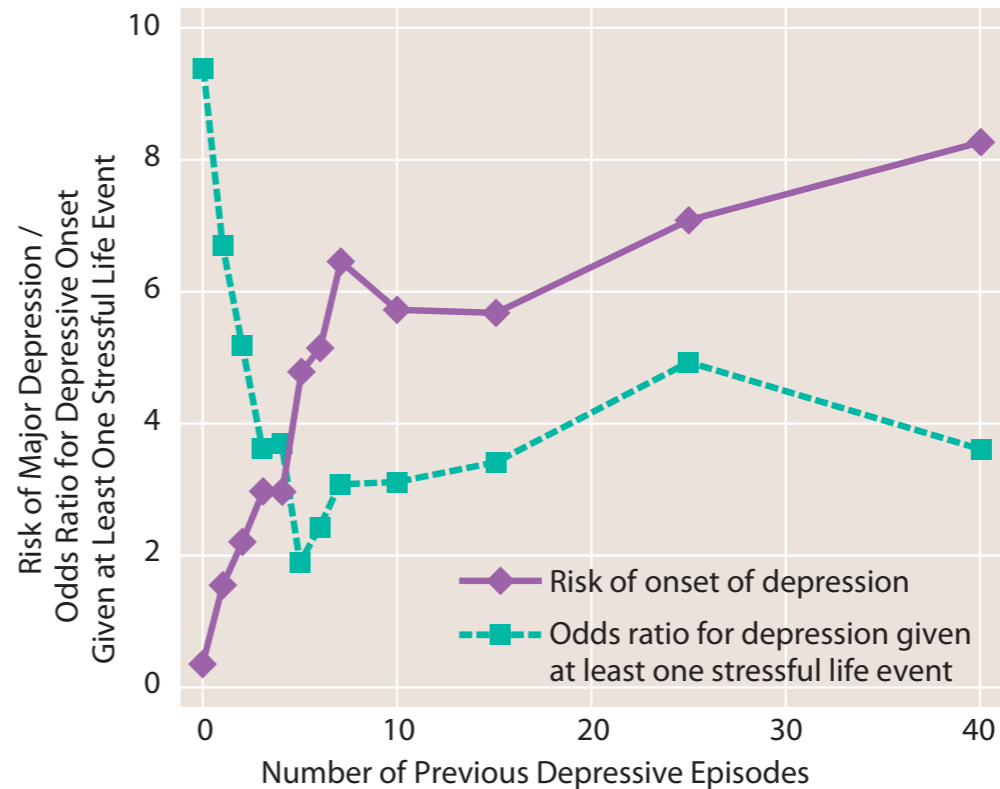
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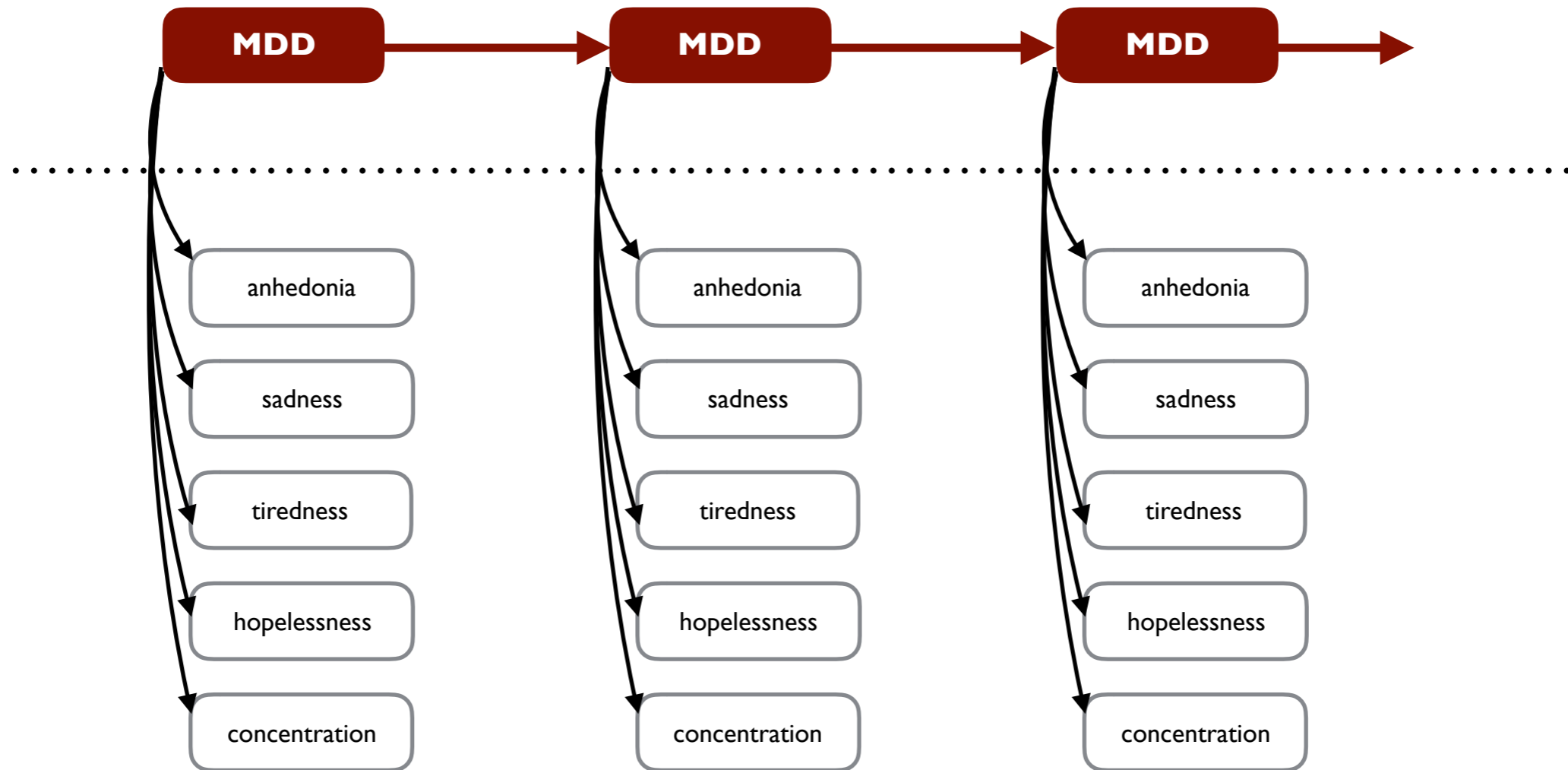
Iacoviello et al., 2010

- ▶ Loss events
- ▶ Severe stress
- ▶ Chronic stress
- ▶ Social defeat
- ▶ Maternal depression
- ▶ But: 30% acausal

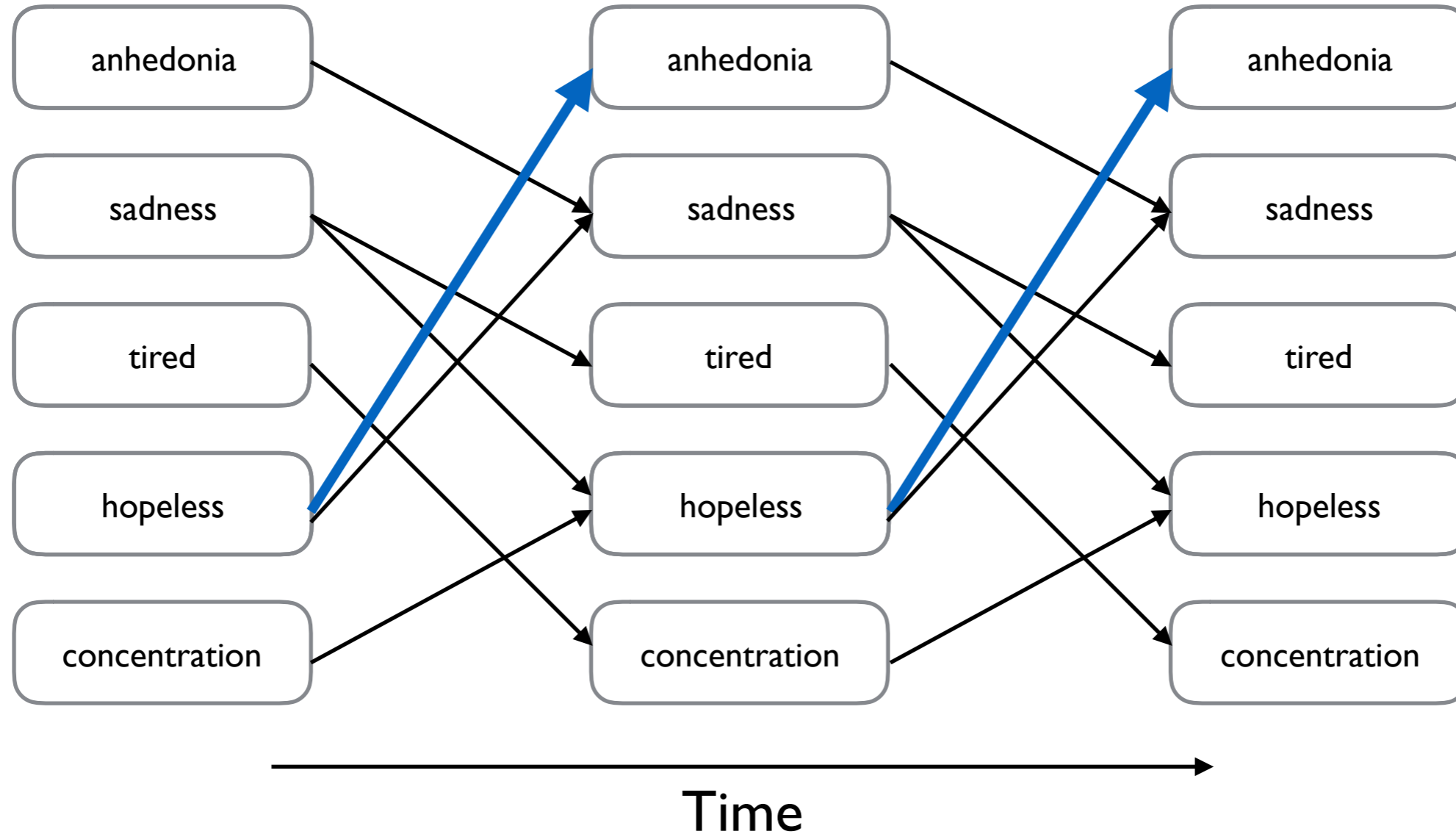


Kendler et al., 2000

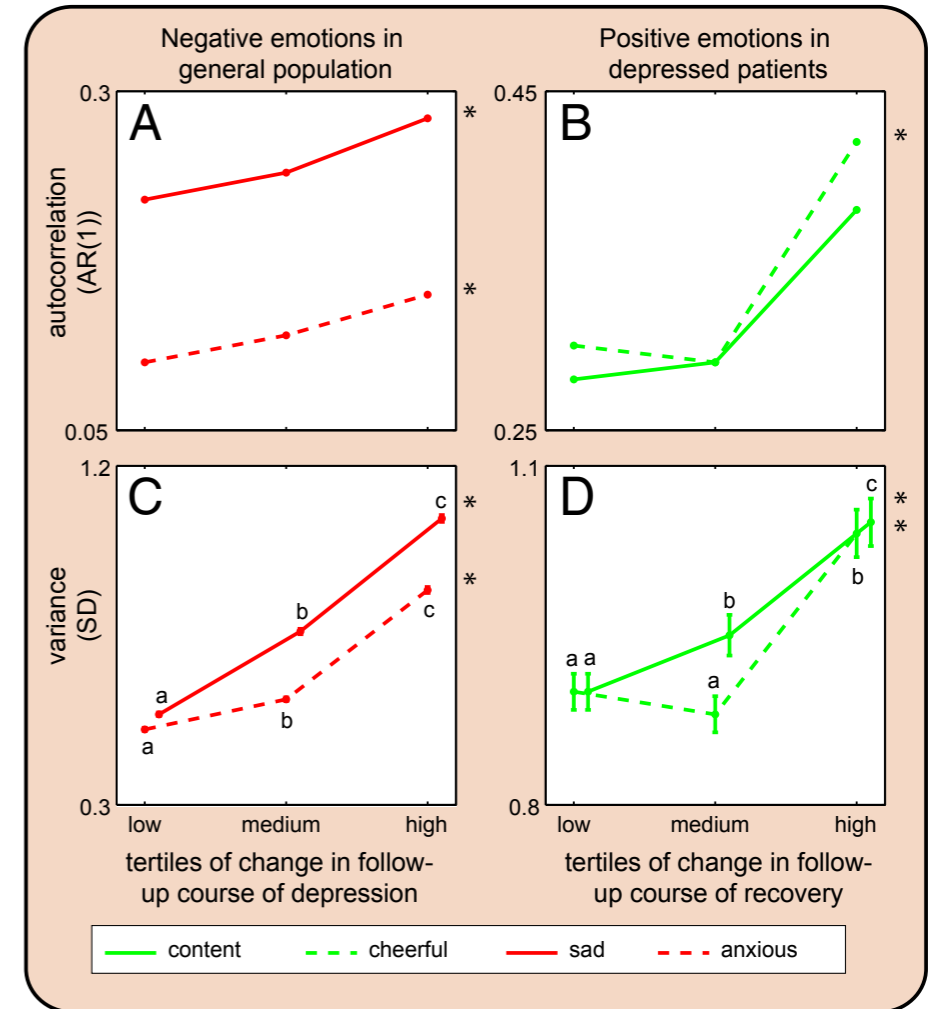
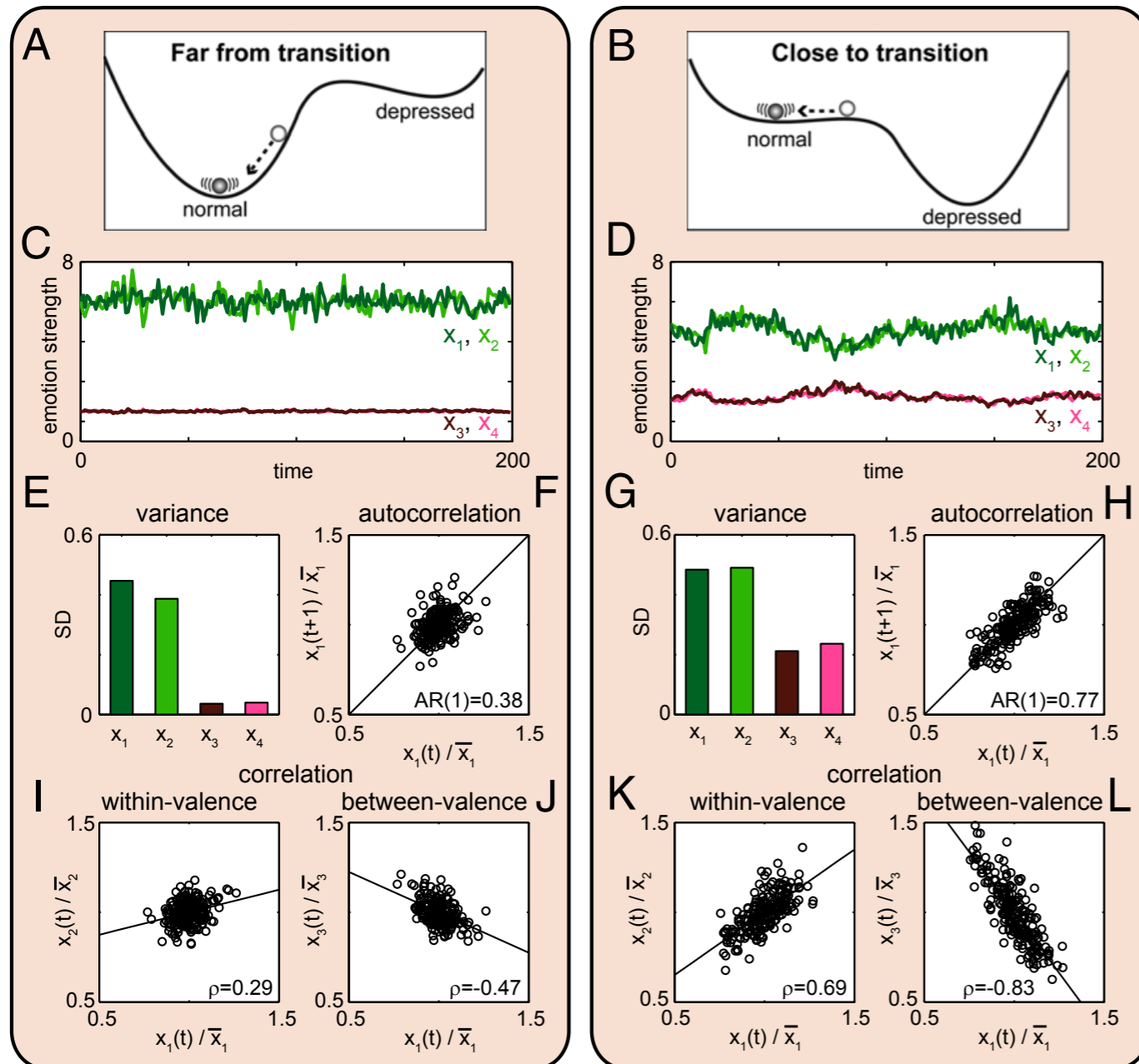
Kendler et al., 1999,2000, Gotlib et al., 2010



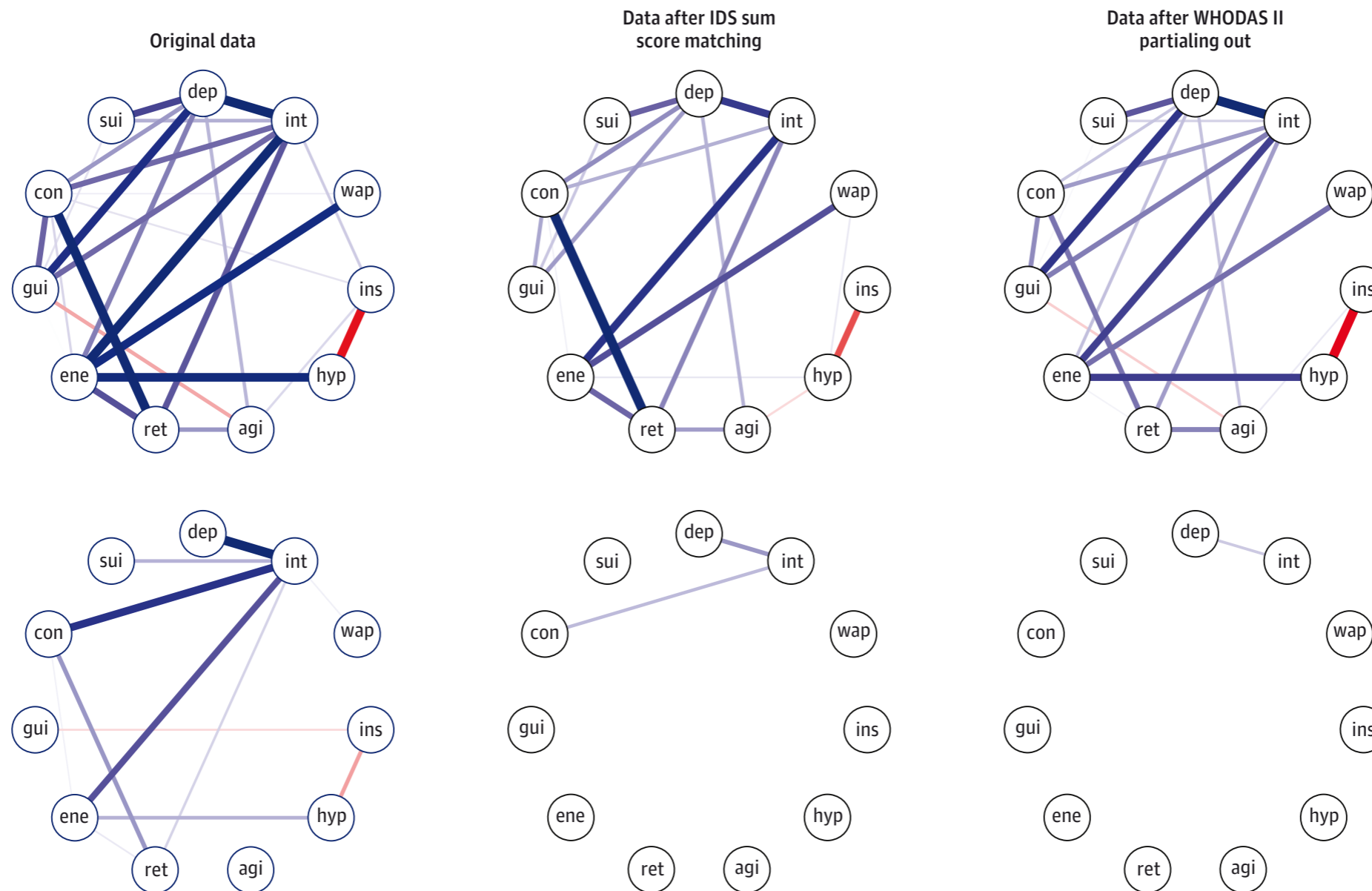
Symptom network model



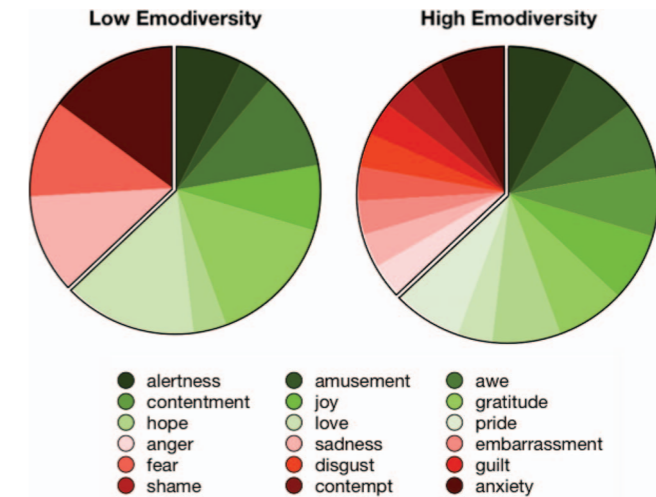
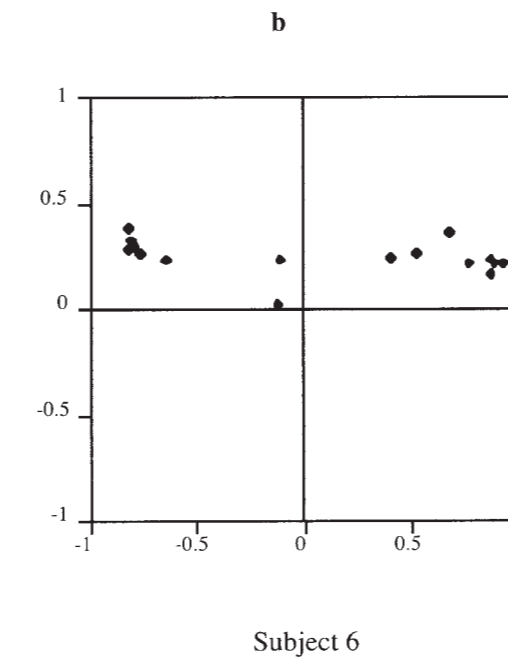
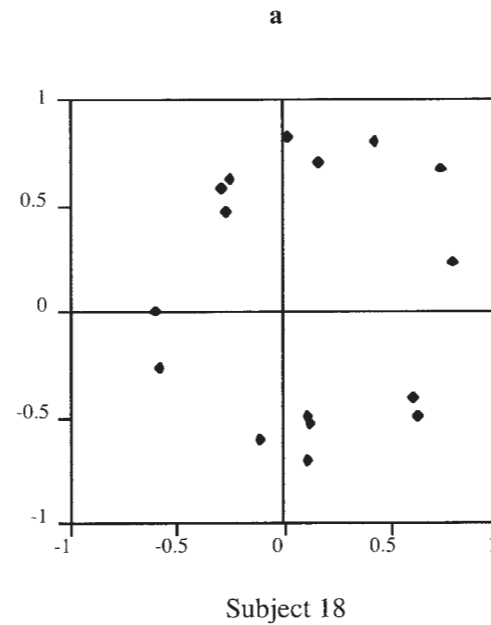
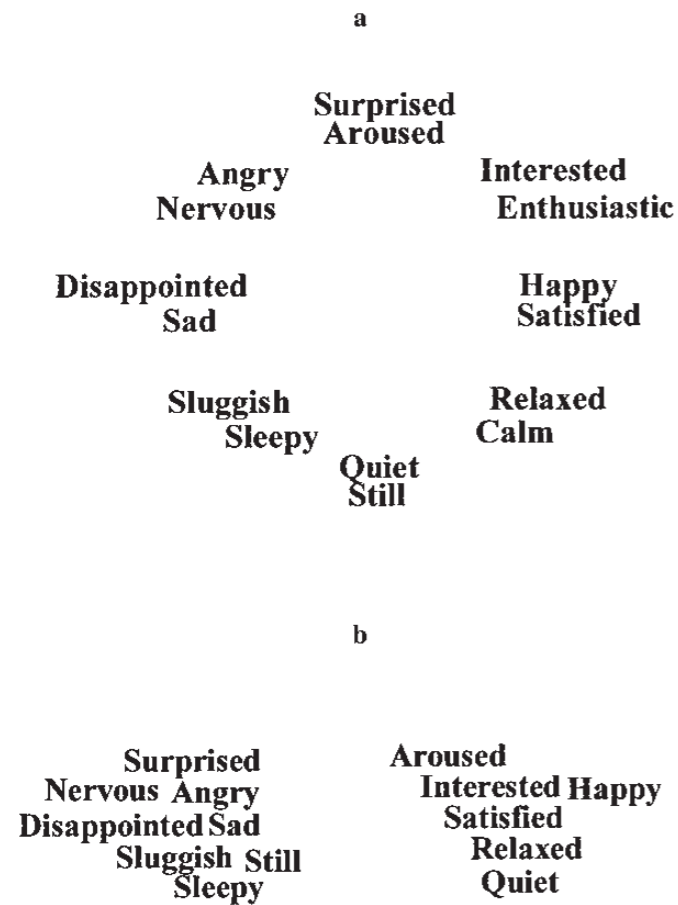
Depression as stable dynamic states



Symptom interactions matter



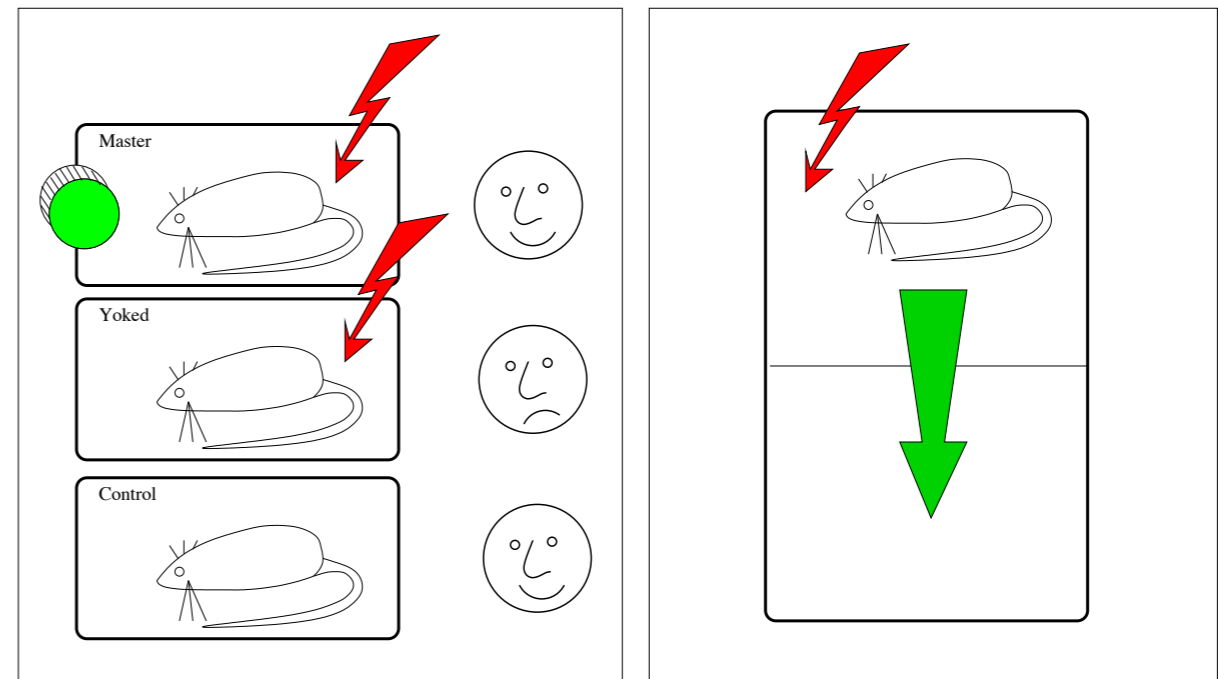
Van Borkulo et al., 2017 JAMA Psych.



- ### Emodiversity
- doctors visits
 - doctors costs to social sec
 - days in hospital
 - medication costs

▶ Learned helplessness

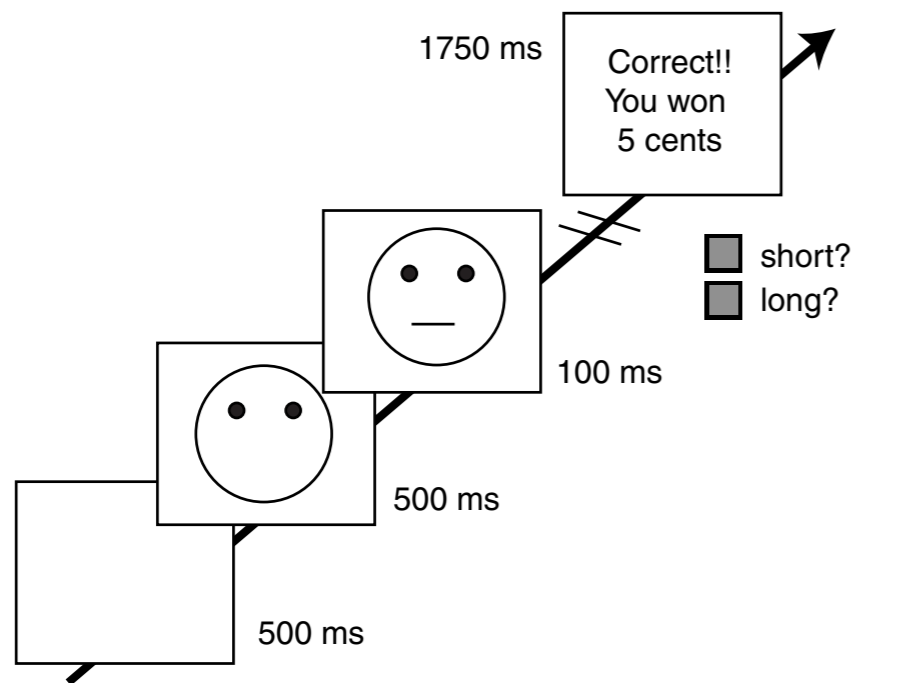
- Uncontrollable shocks
- Escape



▶ Chronic mild stress

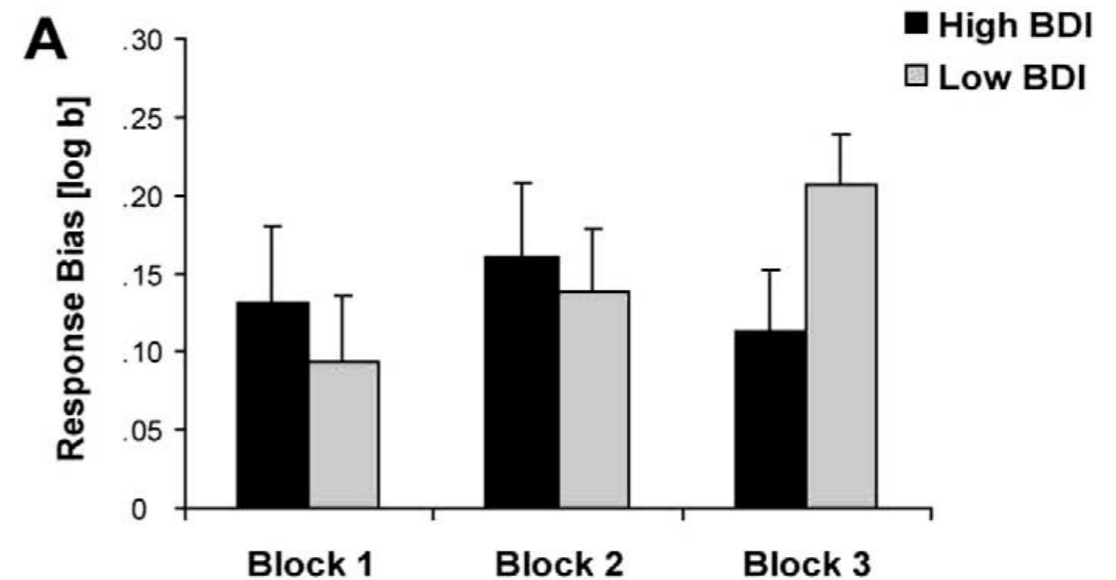
- Chronic bother
- Sucrose preference

Maier & Seligmann 1967; Willner et al., 1982



Long = rich: Long correct: 75% rewarded
Short correct: 30% rewarded

Short = rich: Long correct: 30% rewarded
Short correct: 75% rewarded

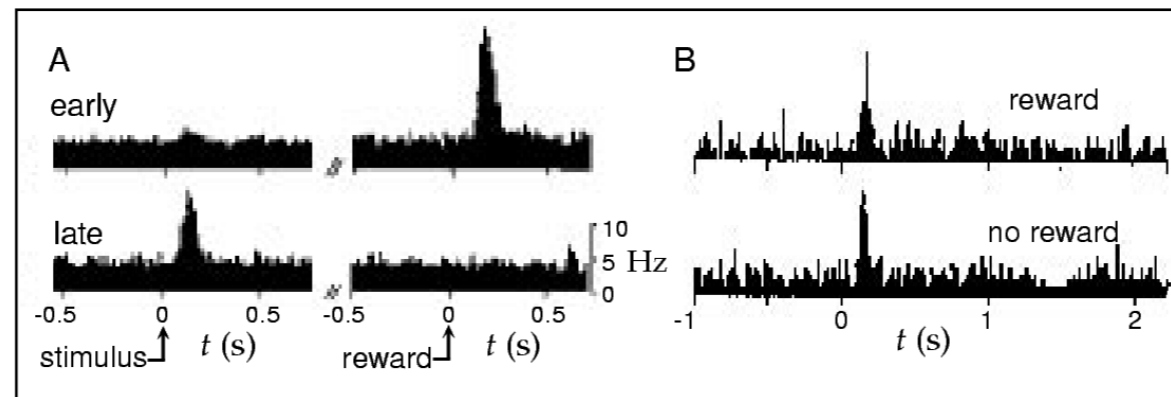


$$Q_t(a, s) = Q_{t-1}(a, s) + \epsilon(r_t - Q_{t-1}(a, s))$$

Kapur and Mann 1992, Muscat et al. 1992, Papp et al. 1994, Willner et al. 1997, Dunlop and Nemeroff 2007, Gershon et al. 2007, Martin-Soelch 2009

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Dopamine



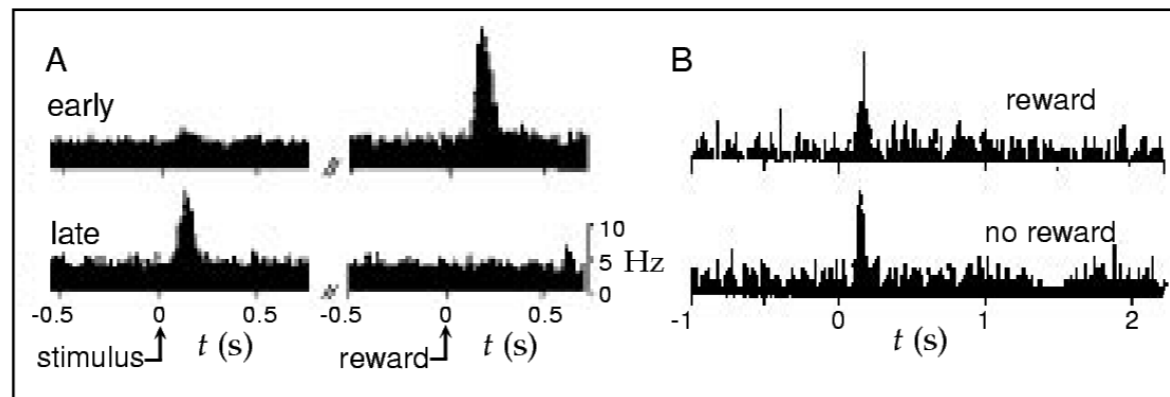
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Anhedonia

Dopamine



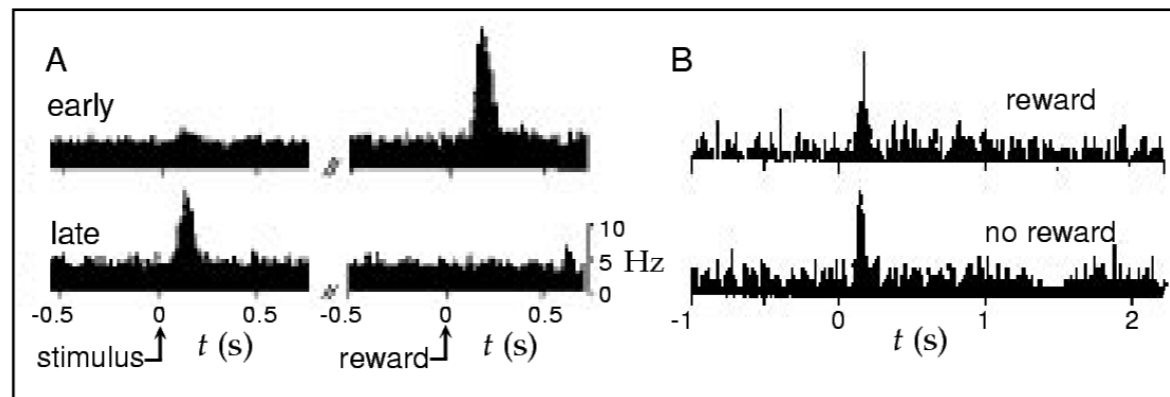
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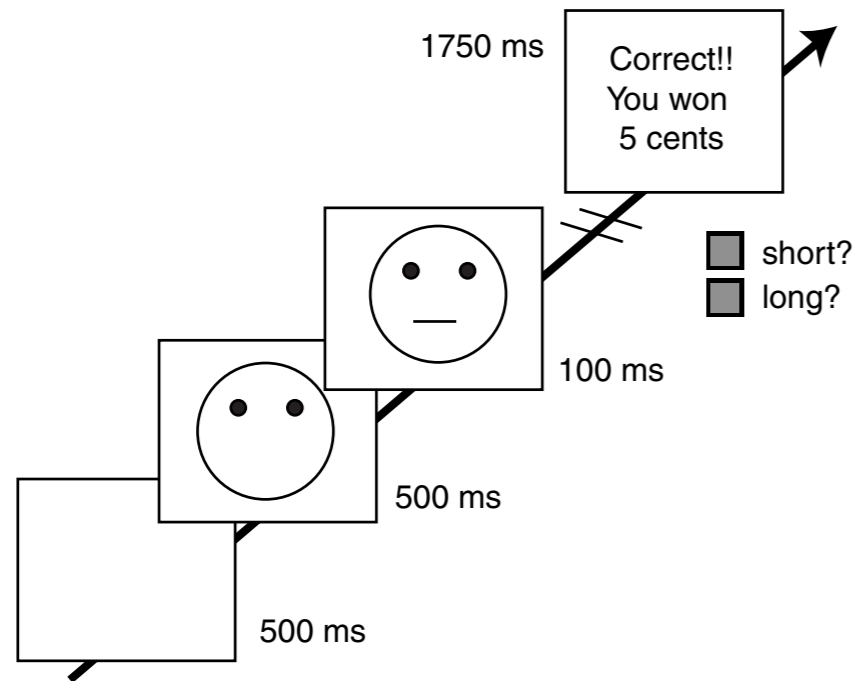
Anhedonia β

Dopamine



Montague et al. 1996, Schultz et al. 1997

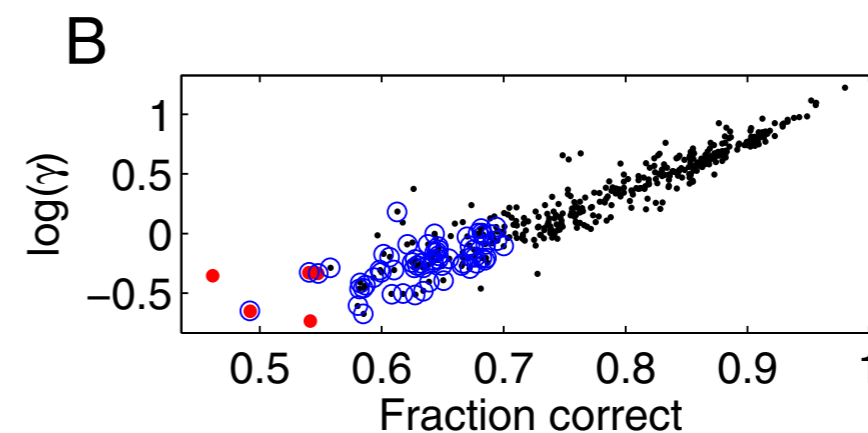
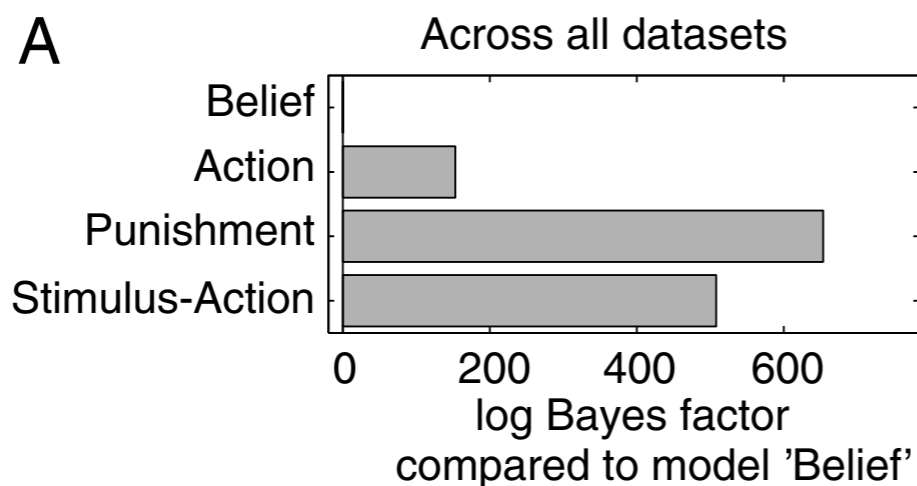
Kapur and Mann 1992, Muscat et al. 1992, Papp et al. 1994, Willner et al. 1997, Dunlop and Nemeroff 2007, Gershon et al. 2007, Martin-Soelch 2009



$$p(a_t|s_t) = \frac{1}{1 + \exp[-(\mathcal{W}_t(a_t, s_t) - \mathcal{W}_t(\bar{a}_t, s_t))]}$$

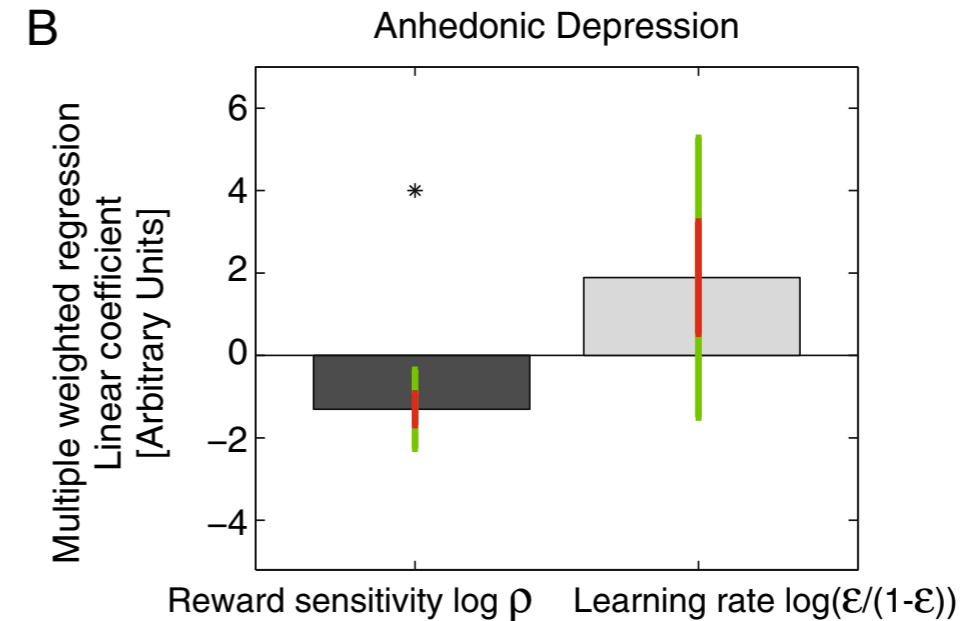
$$\mathcal{W}_t(a_t, s_t) = \gamma \mathcal{I}(a_t, s_t) + \zeta Q_t(a_t, s_t) + (1 - \zeta) Q_t(a_t, \bar{s}_t)$$

Instruction Reward/bias component



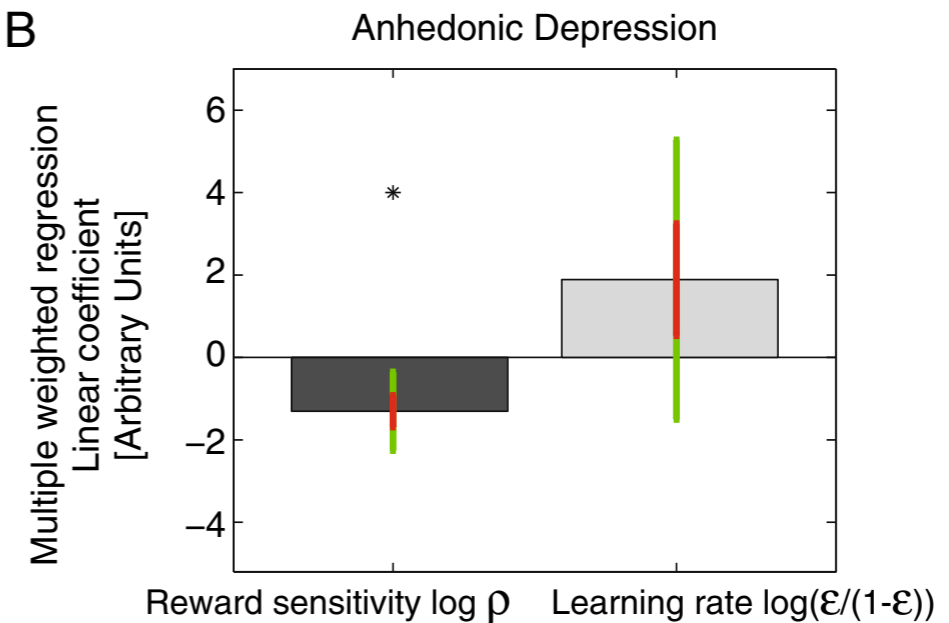
Learning or sensitivity?

- ▶ Correlation of anhedonia is with reward sensitivity, not learning rate

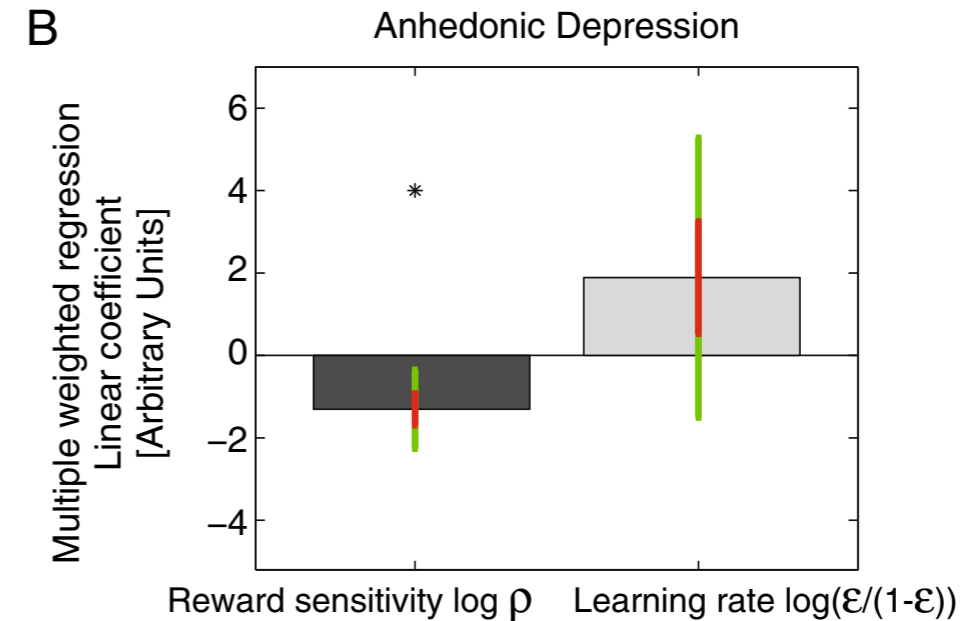


- ▶ Correlation of anhedonia is with reward sensitivity, not learning rate
- ▶ But: correlations

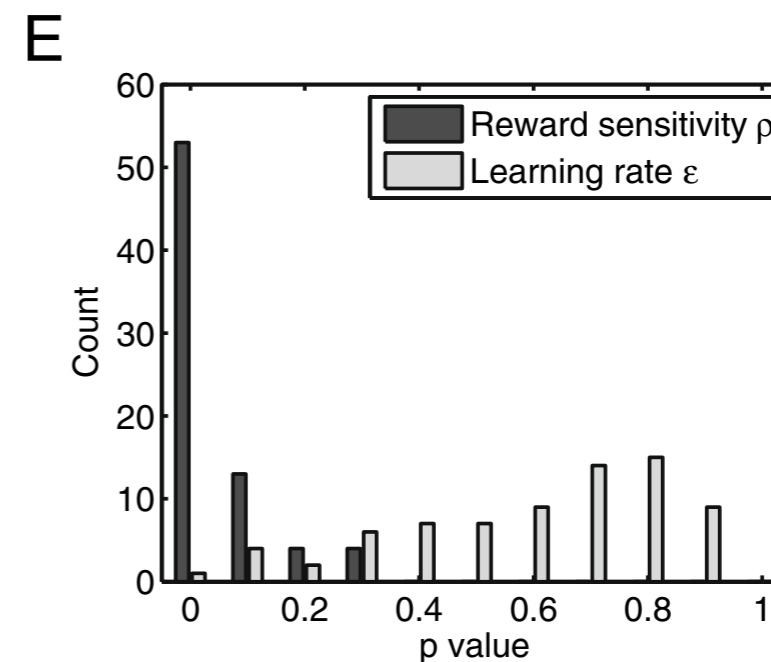
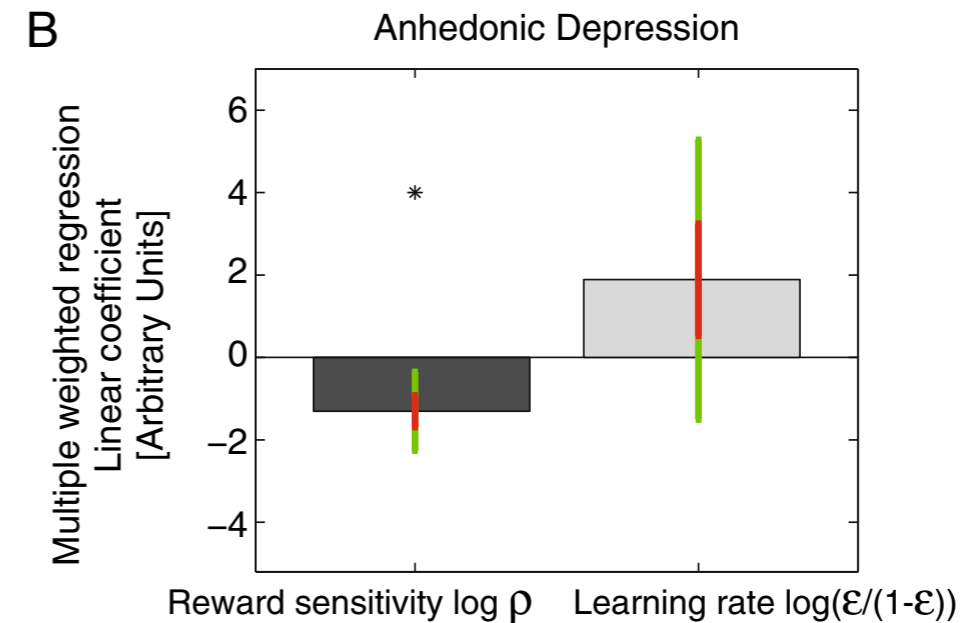
B



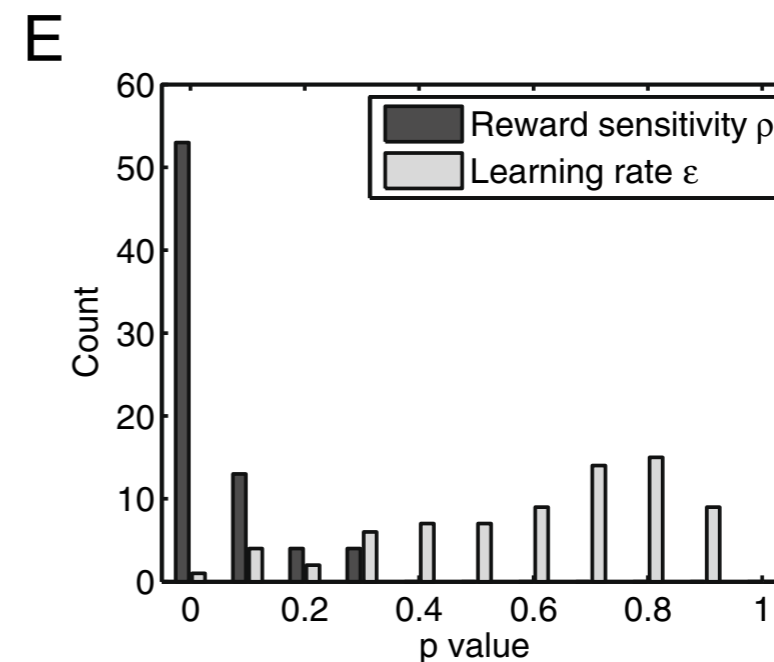
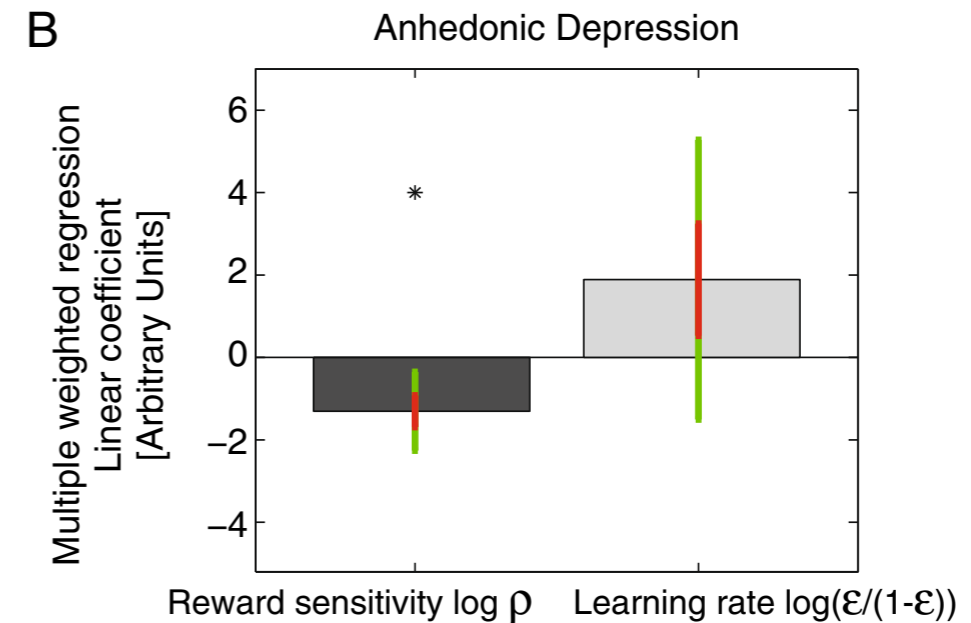
- ▶ Correlation of anhedonia is with reward sensitivity, not learning rate
- ▶ But: correlations
- ▶ Fit, generate surrogate data, examine correlations - has the model really captured something about the data?



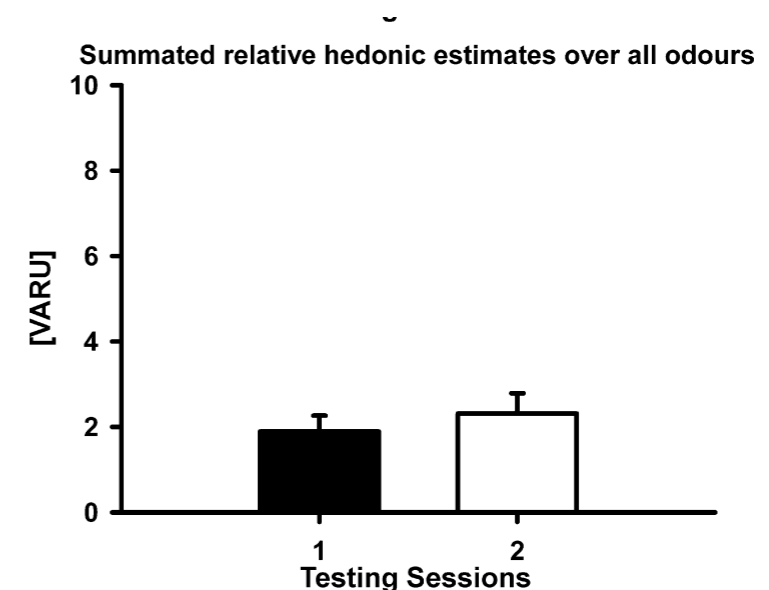
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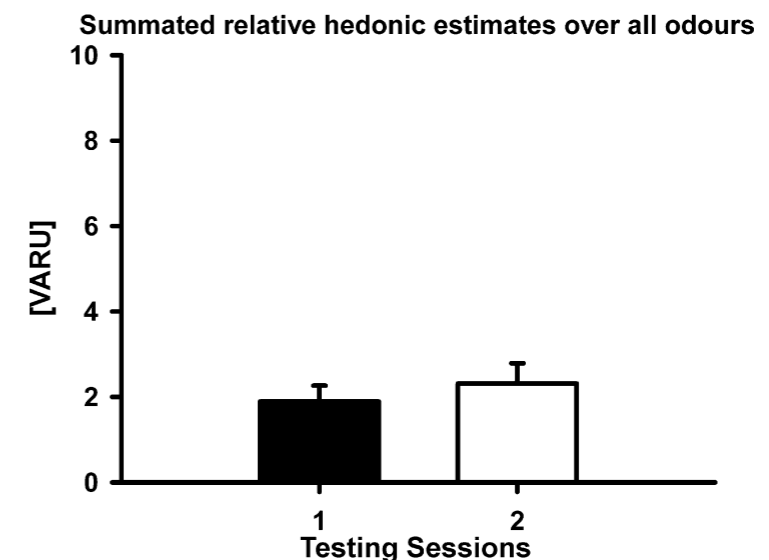
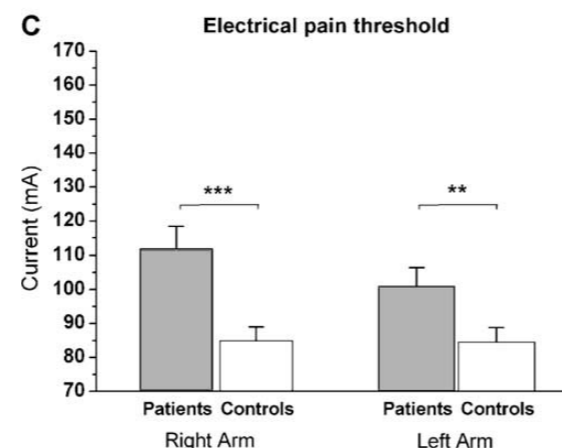
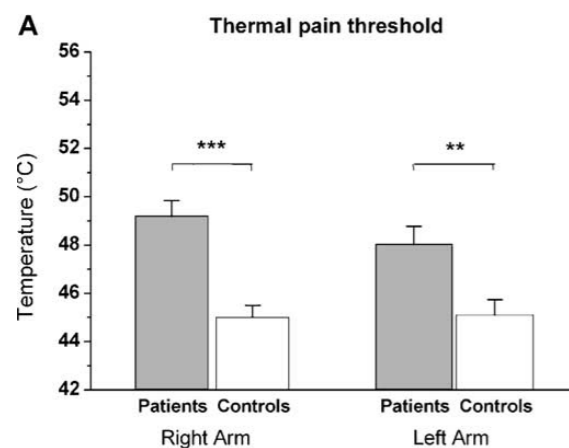
- ▶ Correlation of anhedonia is with reward sensitivity, not learning rate
- ▶ But: correlations
- ▶ Fit, generate surrogate data, examine correlations - has the model really captured something about the data?
- ▶ Not that they can't learn, but don't care.



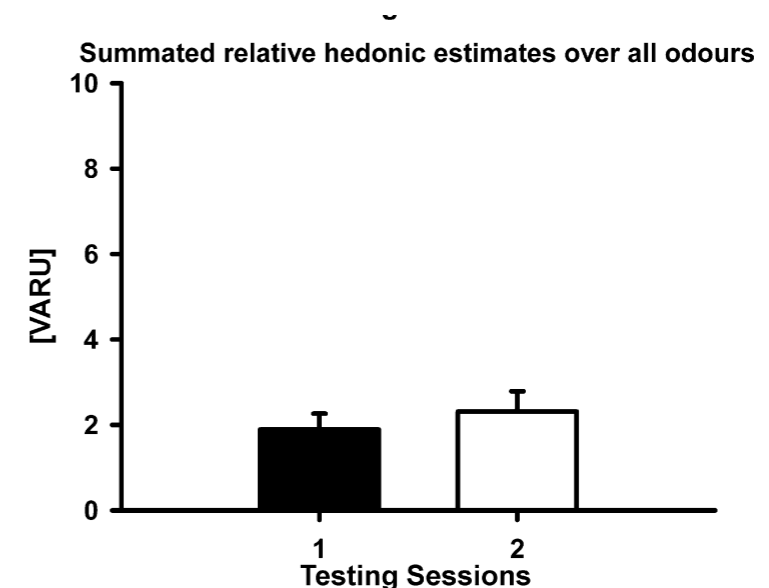
- ▶ diminished interest or pleasure in response to stimuli that were previously perceived as rewarding
- ▶ What is “stimuli”?
 - sucrose preference test
 - standard animal assessment of anhedonia, Willner 1997
 - Dichter et al., 2010
 - no difference between MDD & HC
 - no effect of psychotherapy (BA)
 - Olfaction (Klepce et al., 2010)
 - Pain (e.g. Baer et al., 2005)



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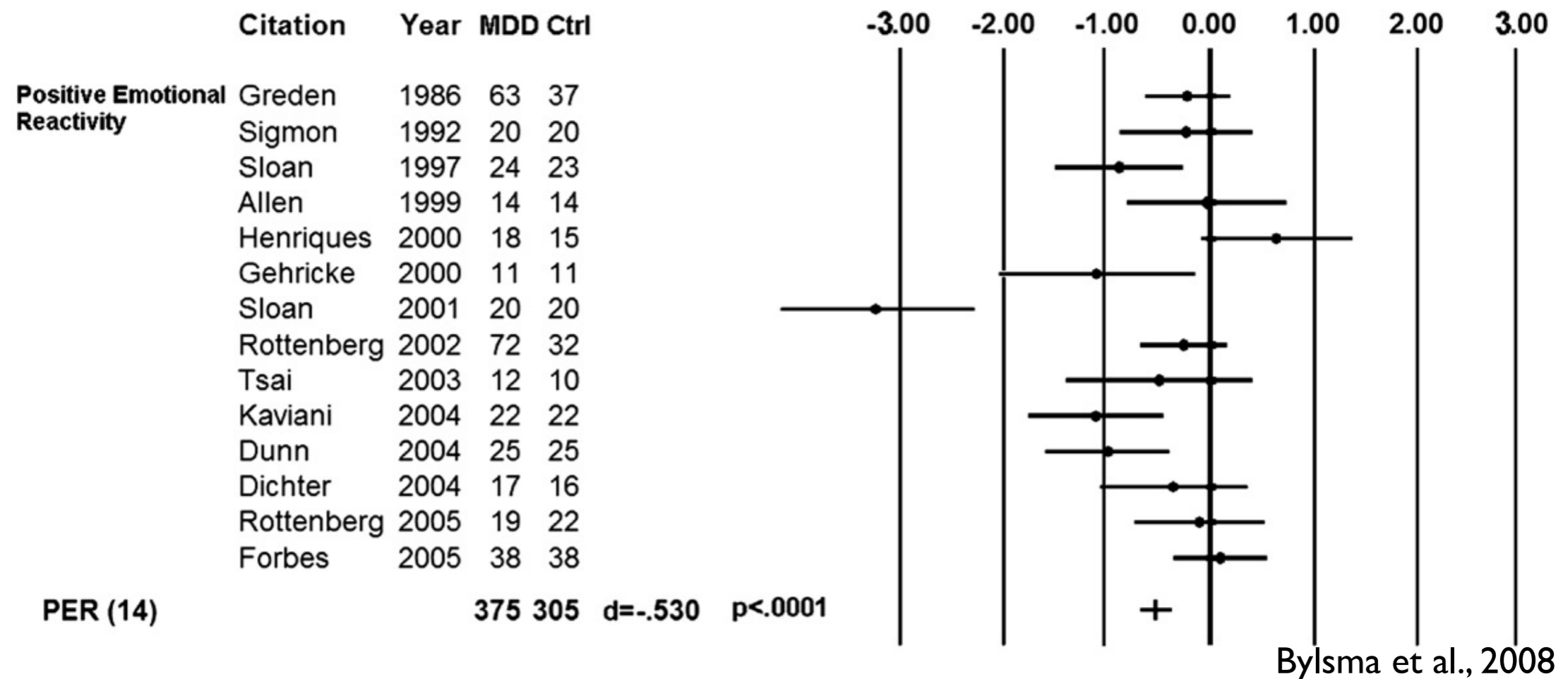


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- ▶ Reduced “emotional” responses to more complex “affective” stimuli

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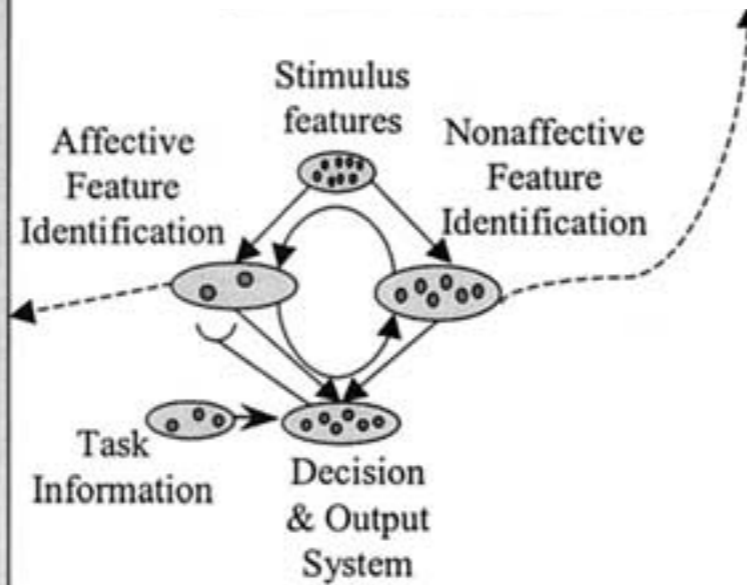
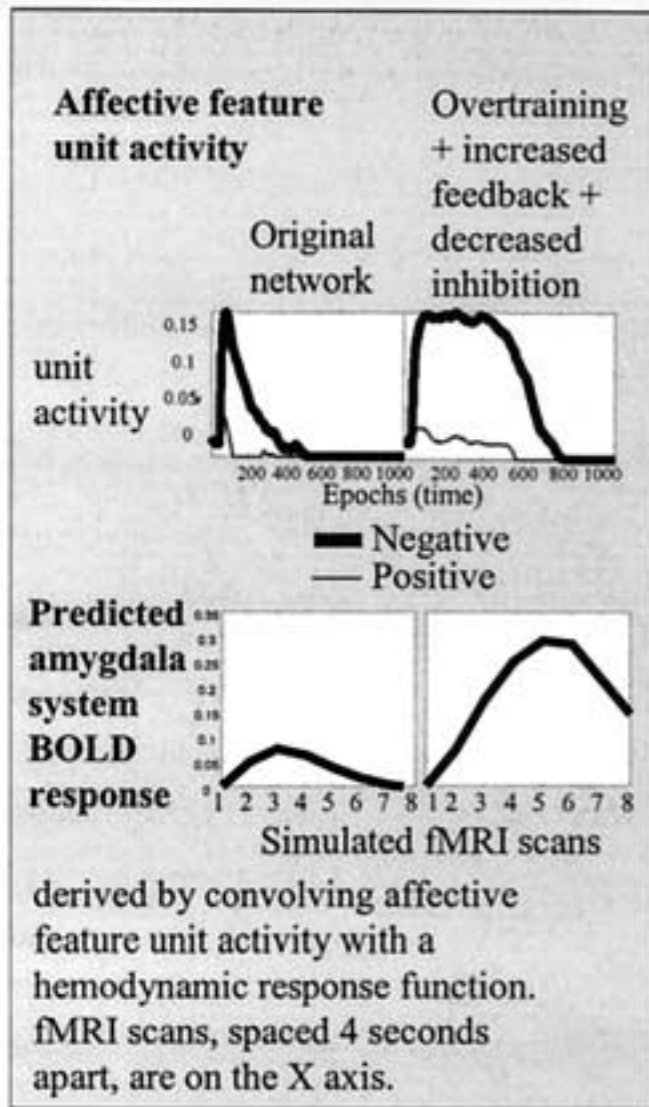


Dysfunctional attitudes

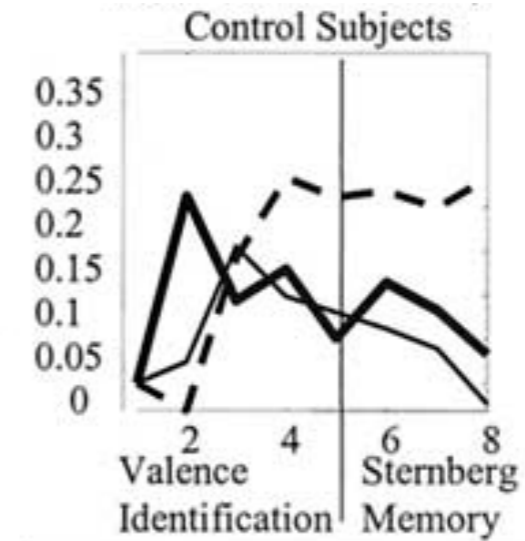
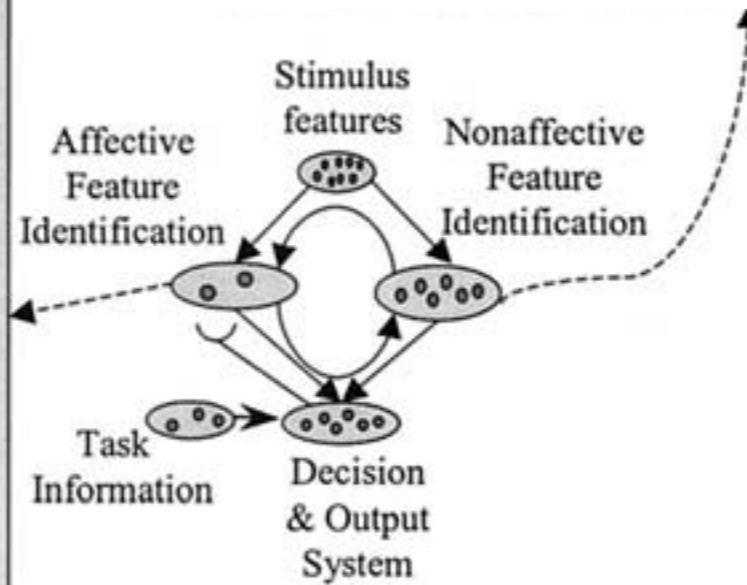
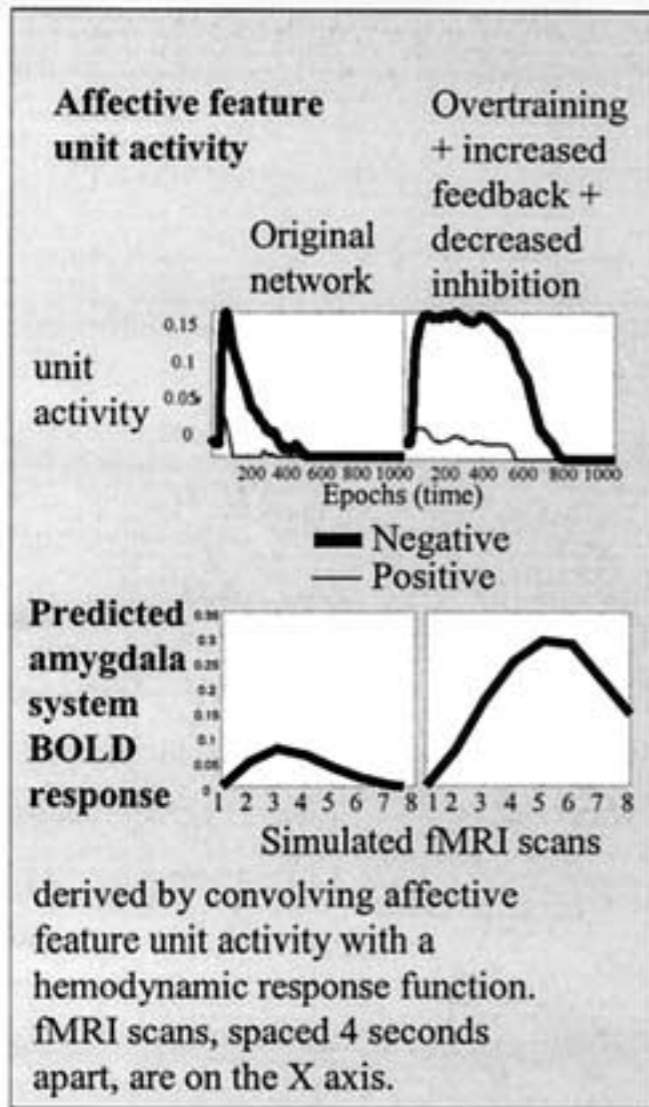
ATTITUDES	TOTALLY AGREE	AGREE VERY MUCH	AGREE SLIGHTLY	NEUTRAL	DISAGREE SLIGHTLY	DISAGREE VERY MUCH	TOTALLY DISAGREE
REMEMBER, ANSWER EACH STATEMENT ACCORDING TO THE WAY YOU THINK <u>MOST OF THE TIME</u> .							
1. It is difficult to be happy unless one is good looking, intelligent, rich and creative.							
2. Happiness is more a matter of my attitude towards myself than the way other people feel about me.							
3. People will probably think less of me if I make a mistake.							
4. If I do not do well all the time, people will not respect me.							
5. Taking even a small risk is foolish because the loss is likely to be a disaster.							
6. It is possible to gain another person's respect without being especially talented at anything.							
7. I cannot be happy unless most people I know admire me.							
8. If a person asks for help, it is a sign of weakness.							

ATTITUDES	TOTALLY AGREE	AGREE VERY MUCH	AGREE SLIGHTLY	NEUTRAL	DISAGREE SLIGHTLY	DISAGREE VERY MUCH	TOTALLY DISAGREE
9. If I do not do as well as other people, it means I am an inferior human being.							
10. If I fail at my work, then I am a failure as a person.							
11. If you cannot do something well, there is little point in doing it at all.							
12. Making mistakes is fine because I can learn from them.							
13. If someone disagrees with me, it probably indicates he does not like me.							
14. If I fail partly, it is as bad as being a complete failure.							
15. If other people know what you are really like, they will think less of you.							
16. I am nothing if a person I love doesn't love me.							
17. One can get pleasure from an activity regardless of the end result.							
18. People should have a reasonable likelihood of success before undertaking anything.							

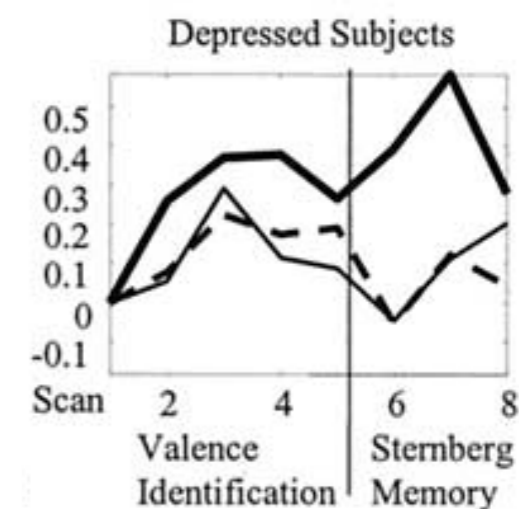
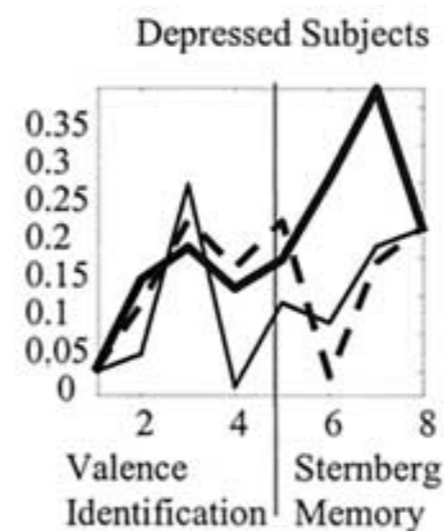
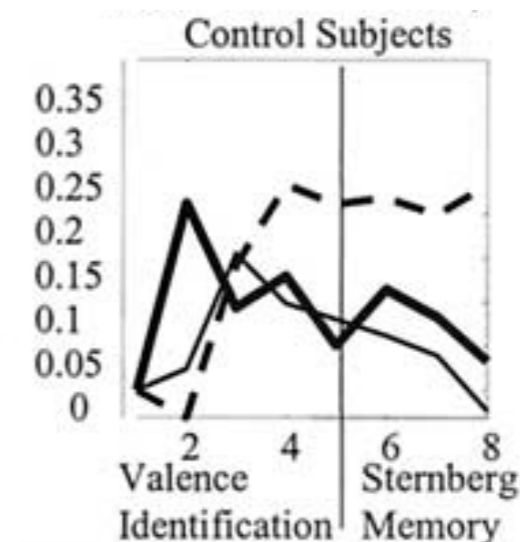
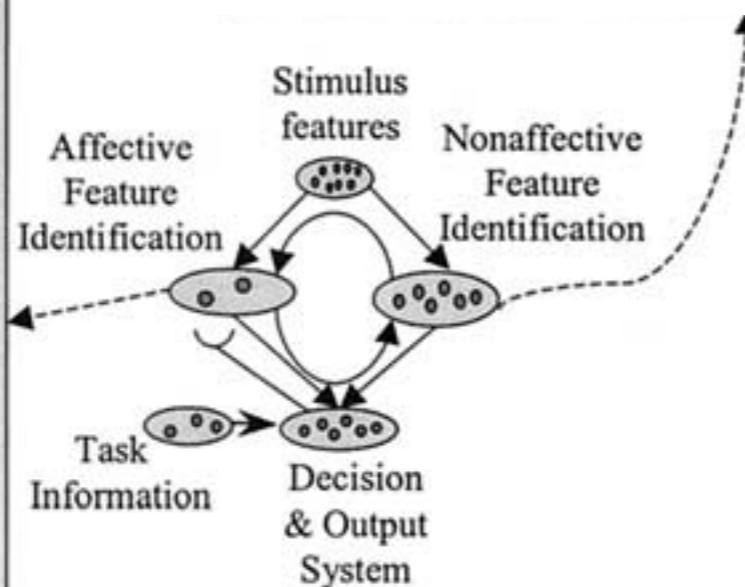
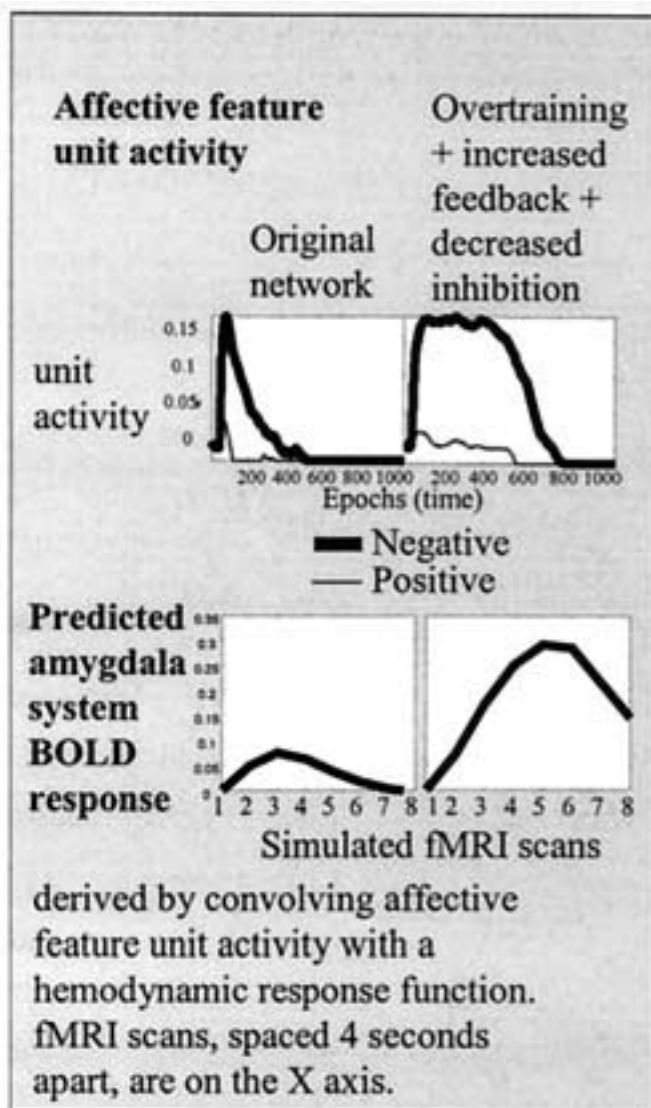
Sticky aversive info



Sticky aversive info



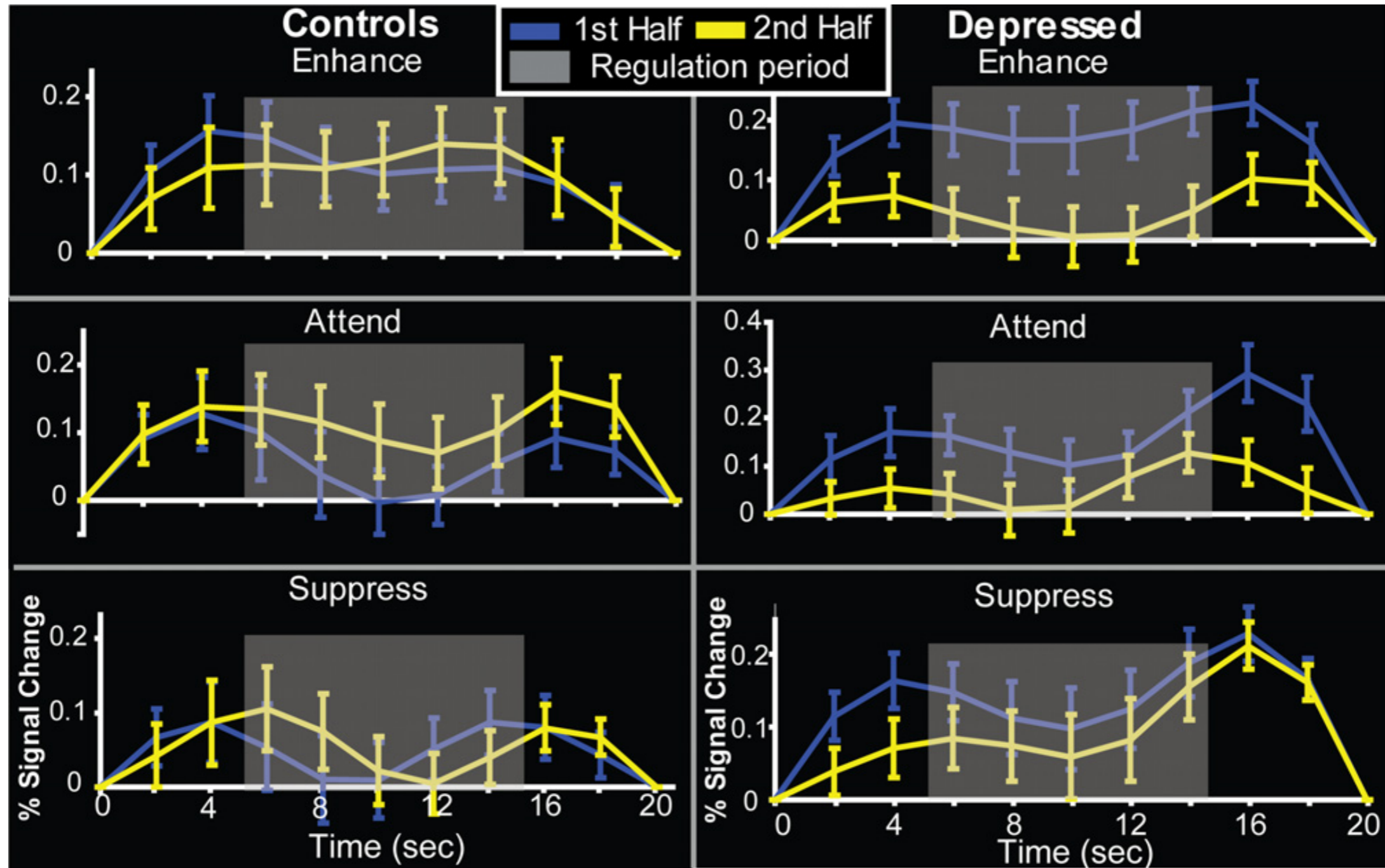
Sticky aversive info



Siegle et al., 1999, 2002

Maintaining positive affect

Ventral Striatal BOLD signal



Heller et al., 2009

- ▶ Hopeless attributions are a risk factor for developing depression

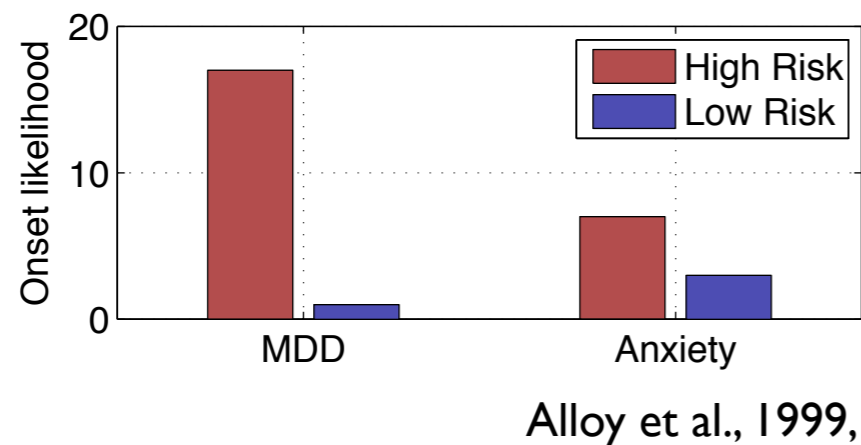
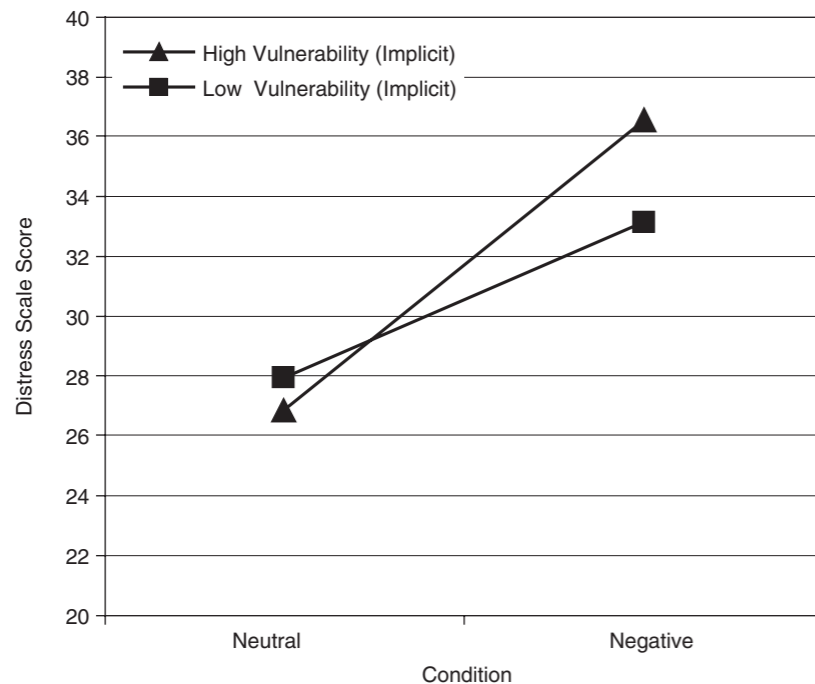


Table 3
Frequency of Symptom Presentation in the Prodromal and Residual Phases (N = 331 Episodes)

Symptom	Prodromal frequency	Residual frequency
Depressed mood	95	79
Decreased appetite	42	40
Weight loss	13	12
Increased appetite	10	12
Weight gain	20	17
Initial insomnia	29	30
Middle insomnia	13	10
Early waking	11	14
Hypersomnia	23	22
Decreased energy	38	35
Decreased interest or pleasure	82	75
Self-blame	51	55
Decreased concentration	78	75
Indecision	6	8
Suicidality	6	5
Psychomotor agitation	6	5
Psychomotor retardation	10	7
Crying more frequently	34	31
Inability to cry	4	2
Hopelessness	195	201
Worrying/Brooding	104	118
Decreased self-esteem	195	199
Irritability	85	72
Dependency	45	46
Self-pity	24	28
Somatic complaints	5	4
Decreased effectiveness	38	37
Helplessness	35	28
Decreased initiation of voluntary responses	19	23

Iacoviello et al., 2010

- ▶ Acute consequence
 - implicit: IAT self-worth
 - explicit: CSQ

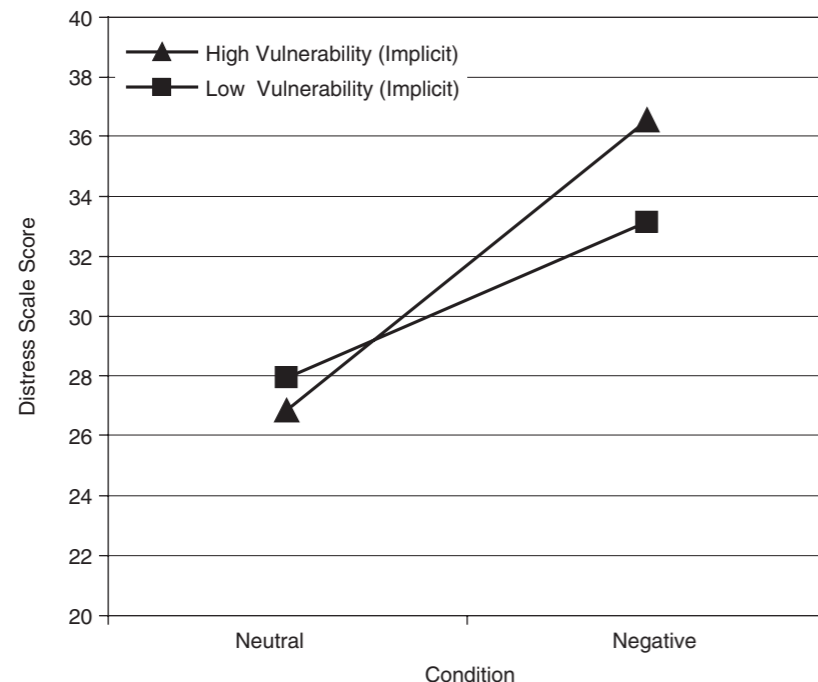


▶ Acute consequence

- implicit: IAT self-worth
- explicit: CSQ

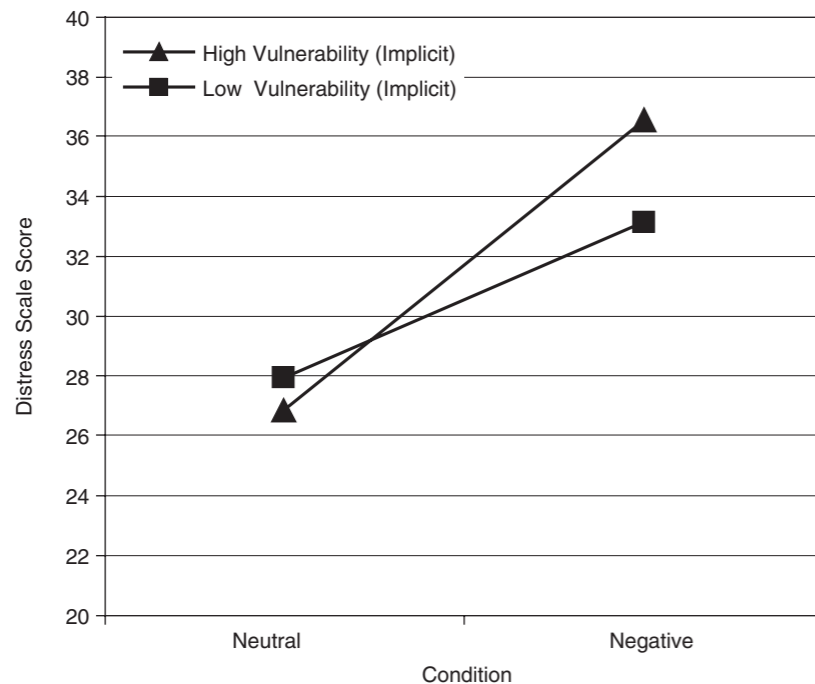
▶ Chronic consequence

- @ 5 weeks only CSQ survives to predict BDI response to acute life stressor



▶ Acute consequence

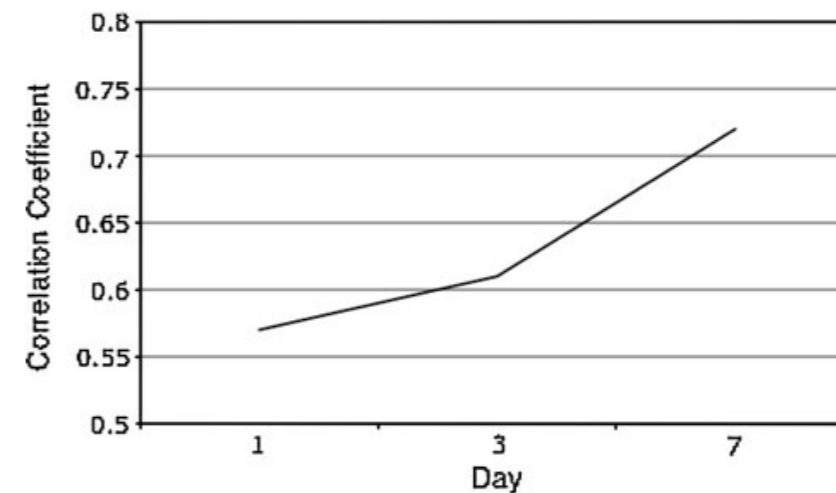
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▶ Chronic consequence

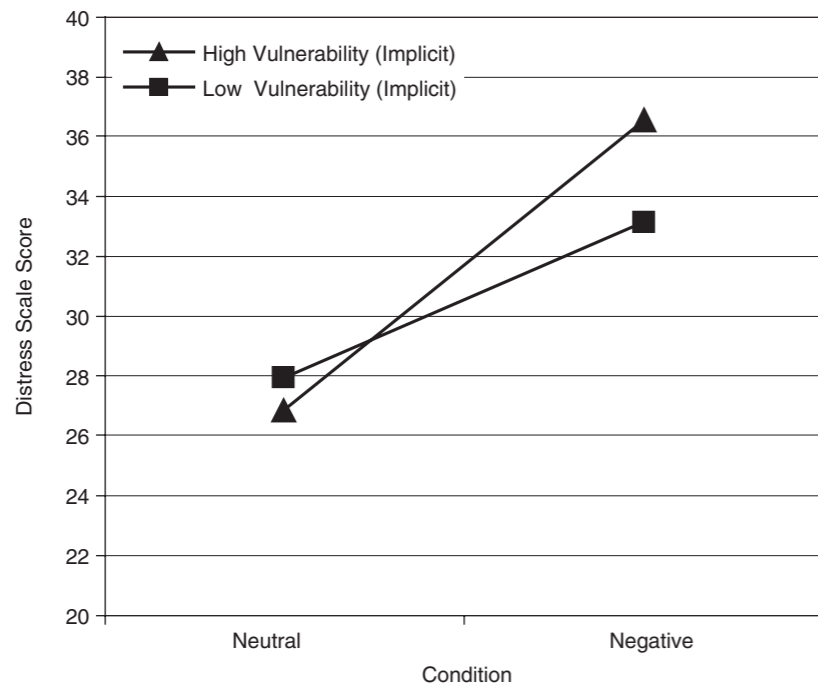
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▶ Evolution over time



▶ Acute consequence

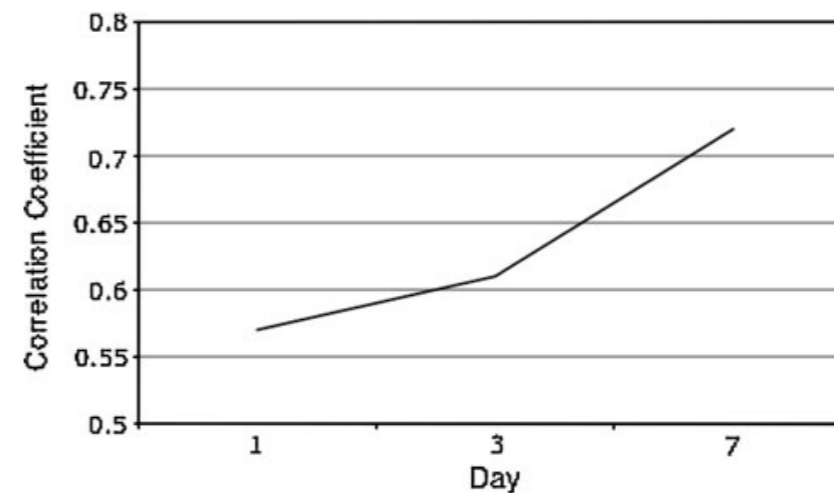
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▶ Chronic consequence

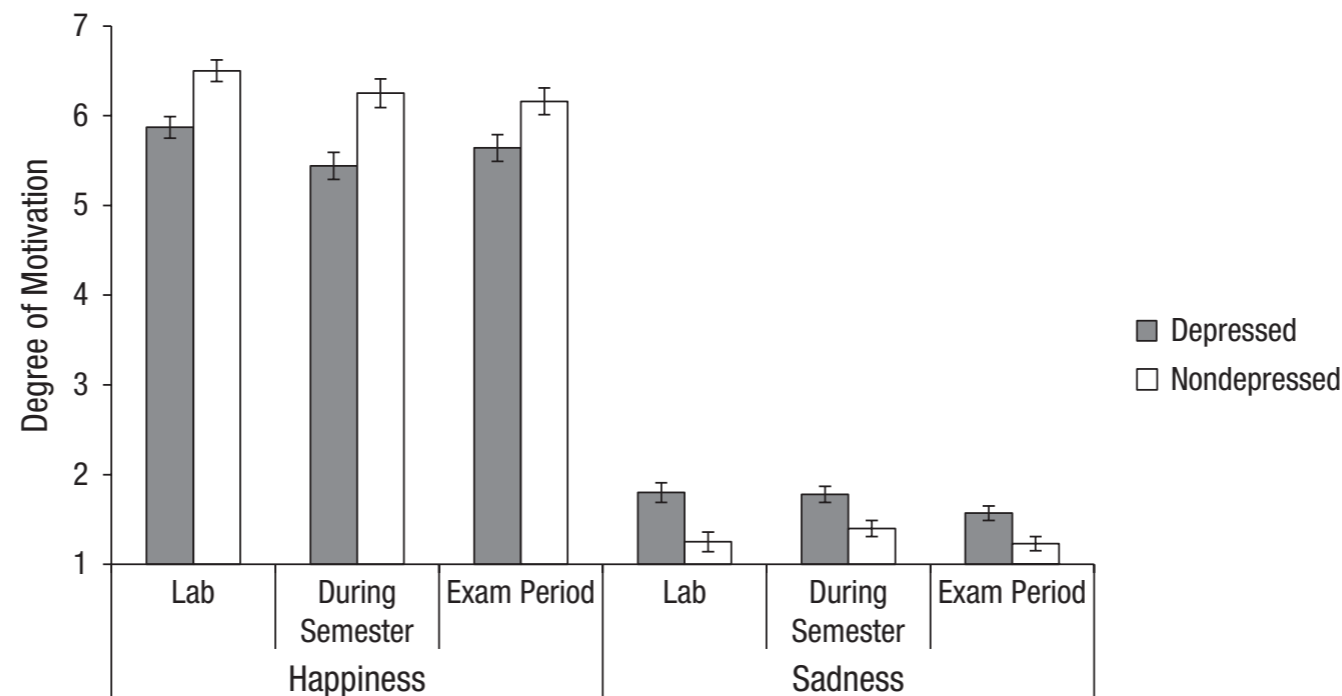
- @ 5 weeks only CSQ survives to predict BDI response to acute life stressor

▶ Evolution over time



- -> explicit interpretations determine long-term outcome
- -> both implicit and explicit determine immediate outcome

- ▶ Is effective - but less frequently used (Ehring et al., 2010).
- ▶ Motivation to feel particular emotions is altered:



- ▶ Innate “affective” behavioural reflexes exist in humans
 - Relate to mental health
- ▶ But: emotions are not “emotional reflexes”
 - Facial expression, recognition
 - Physiological variability
 - Neural representations
- ▶ Have an important **interoceptive** component
- ▶ Are extremely variable
- ▶ Depend fundamentally on interpretation - on the “**model**” we build of our world and how we choose to sample it - “**metareasoning**”