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center for behavioral
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***iCrea**

ESR 9 & 10: Modelling & MRI

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**1. Context-dependent functional connectivity:
emerges from fixed structural connectivity**

**2. Dynamics of perceptual representations:
characterizing collective stable states**

**3. Spontaneous ongoing attention dynamics:
multi-stable displays and/or continuous
shape morphing**

1. Context-dependence of functional connectivity

Deco, Friston, Hagmann, Mantini, Corbetta, 2013

Structural connectivity:

Anatomical connectivity skeleton established by diffusion spectrum imaging.

Functional connectivity:

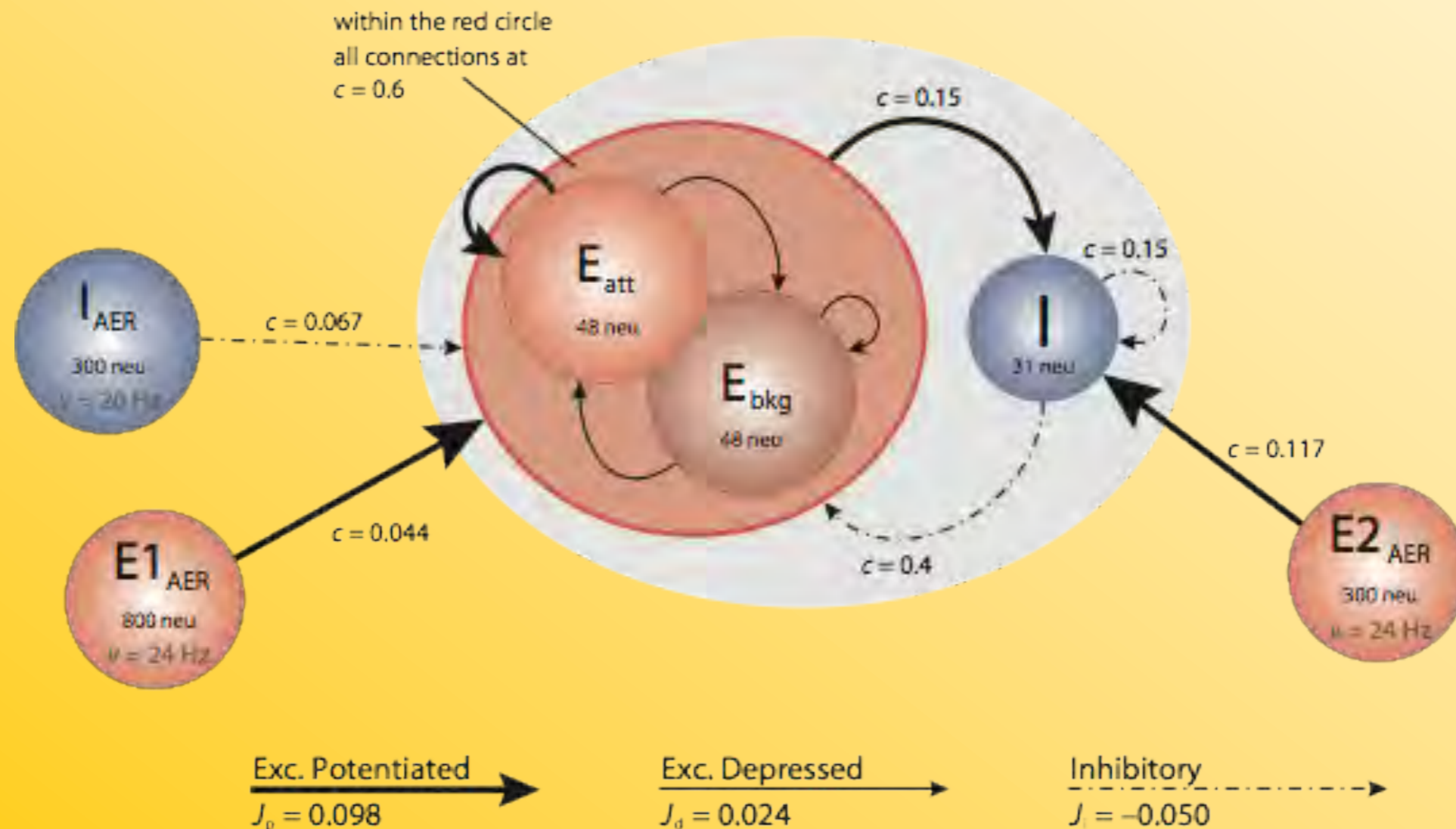
Statistical dependence between dynamics at remote sites.

Effective connectivity:

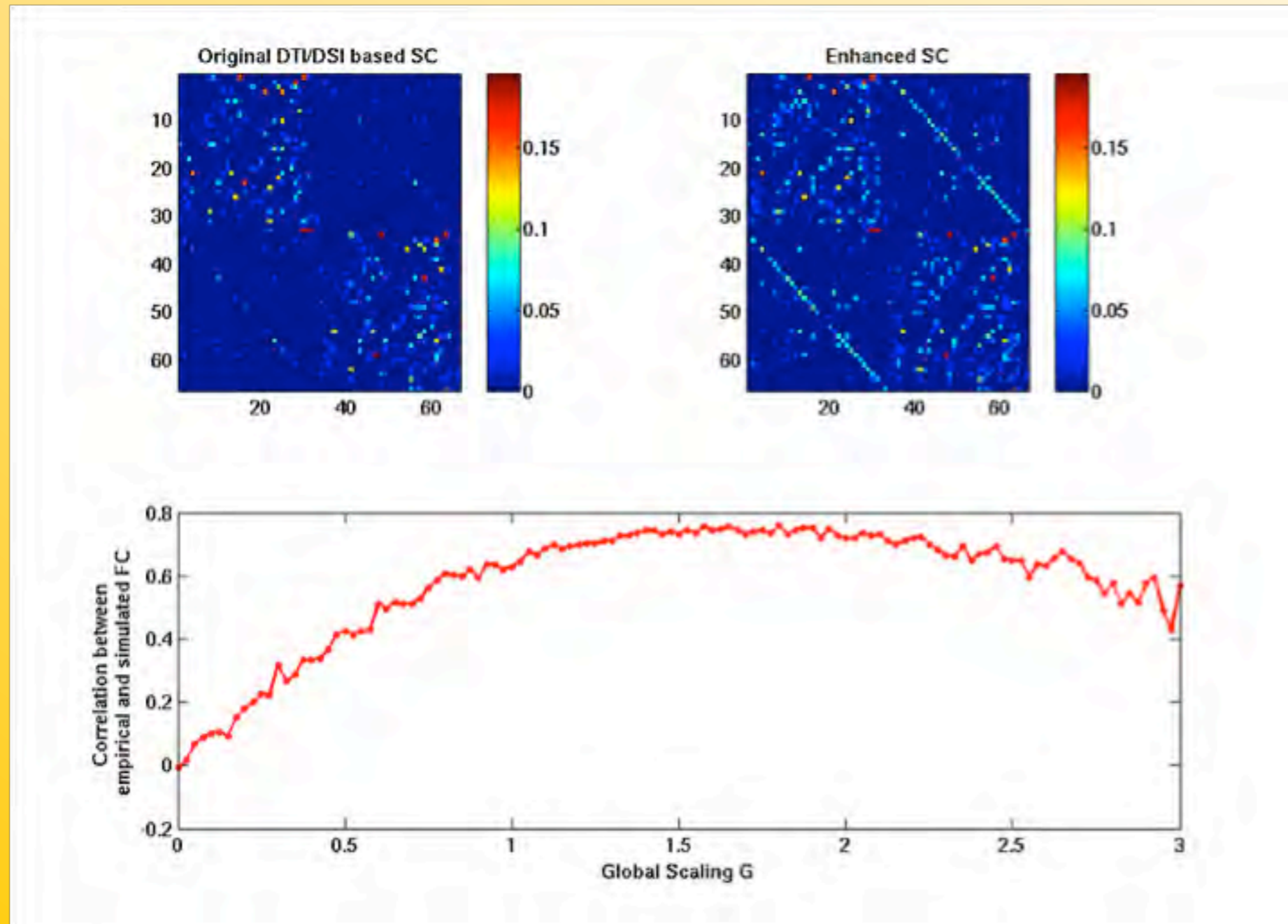
Simplest structural connectivity to replicate functional connectivity (e.g., dynamic causal modelling).

How can the same structural connectivity yield different effective connectivities in different task contexts?

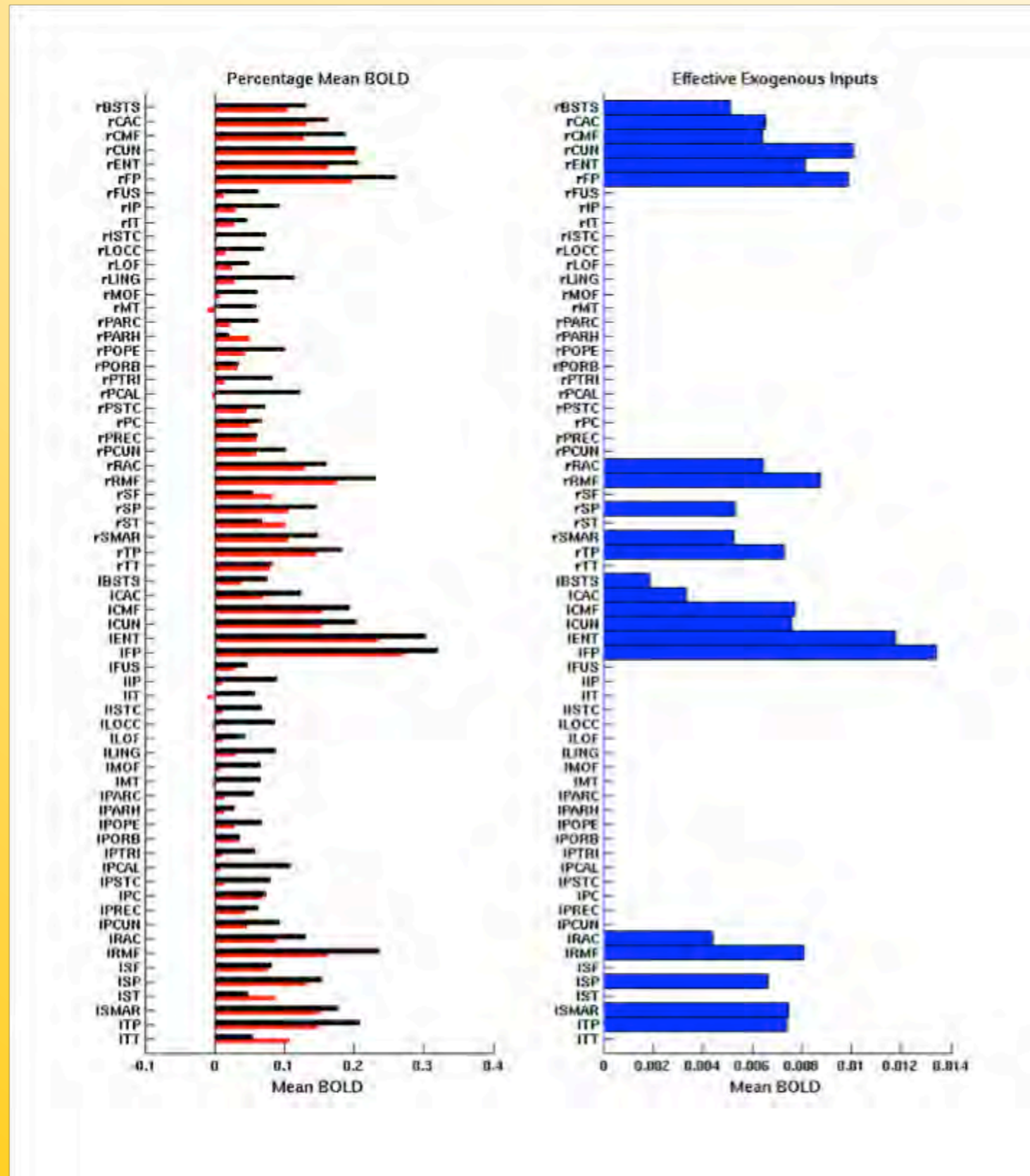
Step 1: Build local nodes with excitatory and inhibitory neurons to obtain spontaneous activity of 3 Hz. In combination with local input, recurrent connectivity may create an additional steady-state at a higher level of activity.



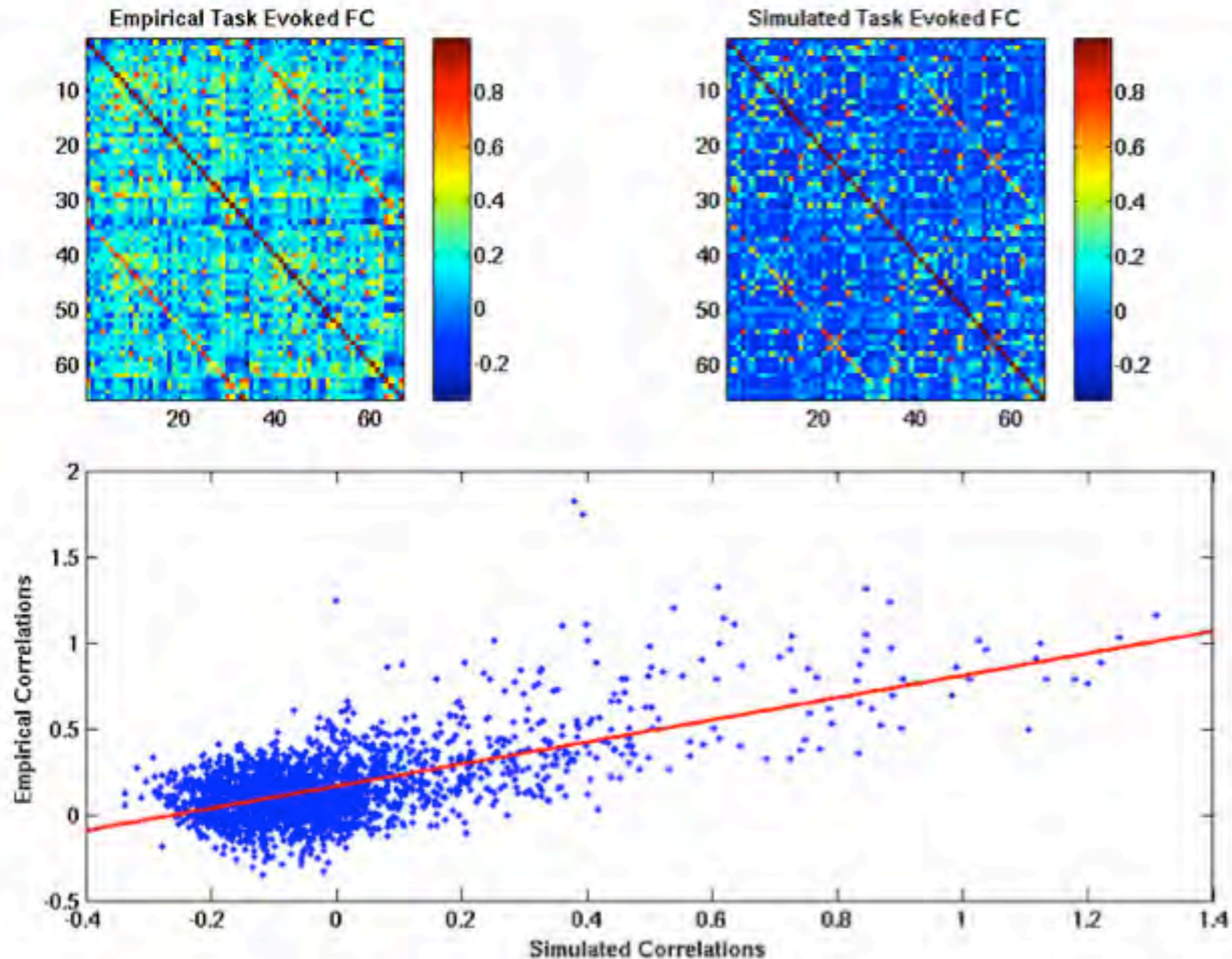
Step 2: Establish structural connectivity matrix SC (with DSI). Scale overall connection strength to destabilize global dynamics and to maximize correlation with resting-state FC.



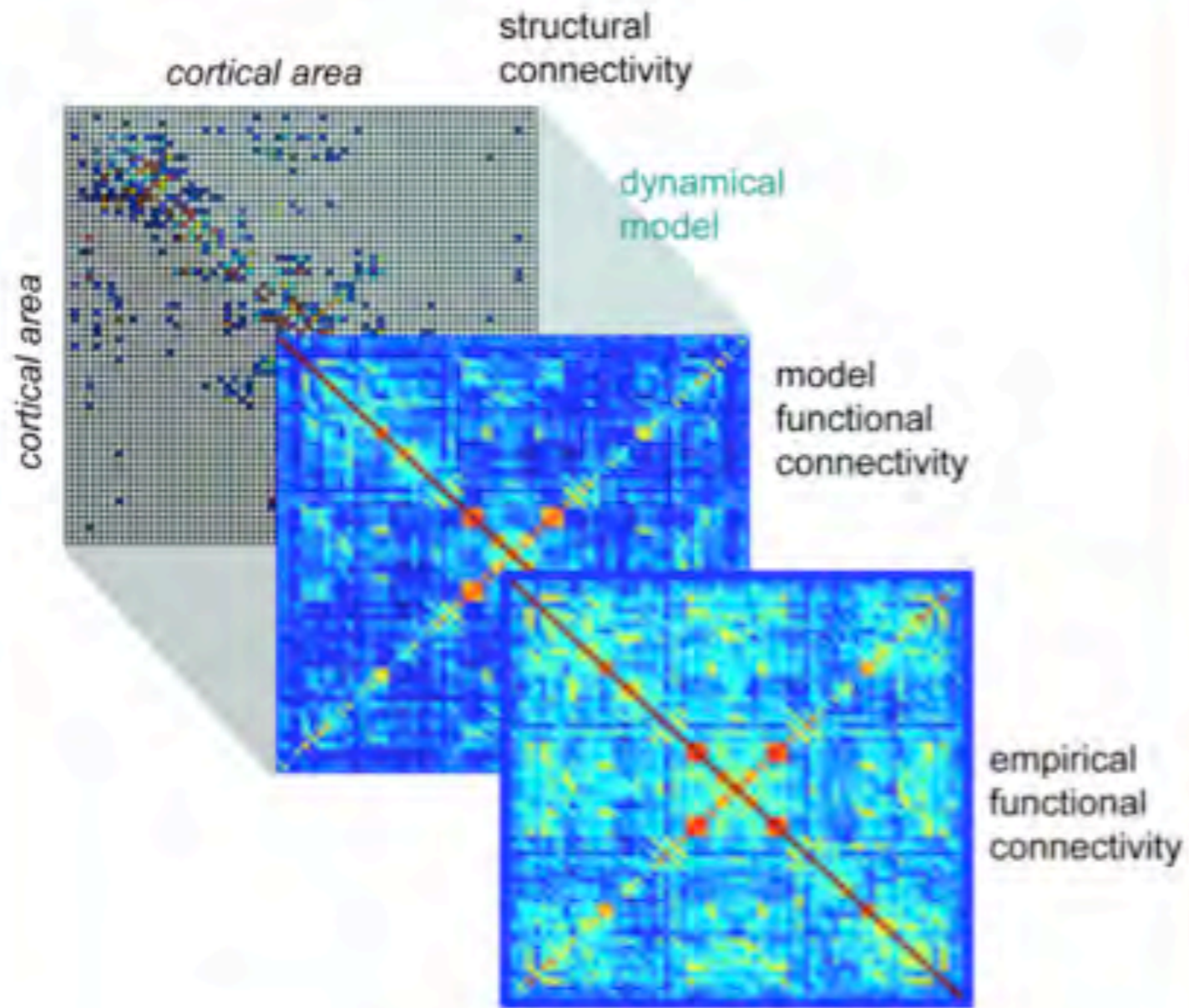
Step 3 (first-order fit): Iteratively adjust local inputs to maximize correlation with task-state BOLD activity.



Step 4 (Second-order validation): Compare FC prediction of driven model with observed task-state FC.



(a) Conceptual Framework



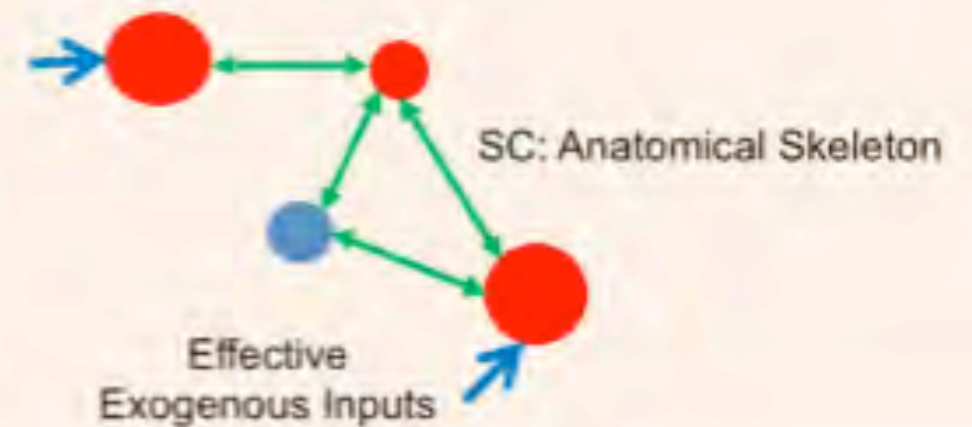
(b) Resting State FC



(c) Task Evoked FC: Effective Connectivity



(d) Task Evoked FC: Effective Dynamics



Deco, Friston, Hagmann, Mantini, Corbetta, 2013

A. DCM accounts for FC by individually adjusting N^2 effective connection weights.

Functional connectivity N^2 modelled in terms of effective N^2 connectivity.

B. Gustavo accounts for FC by individually adjusting N local tonic input levels.

Local inputs alter non-linear dynamics of N individual nodes.

Altered average activity predicts N local BOLD signals.

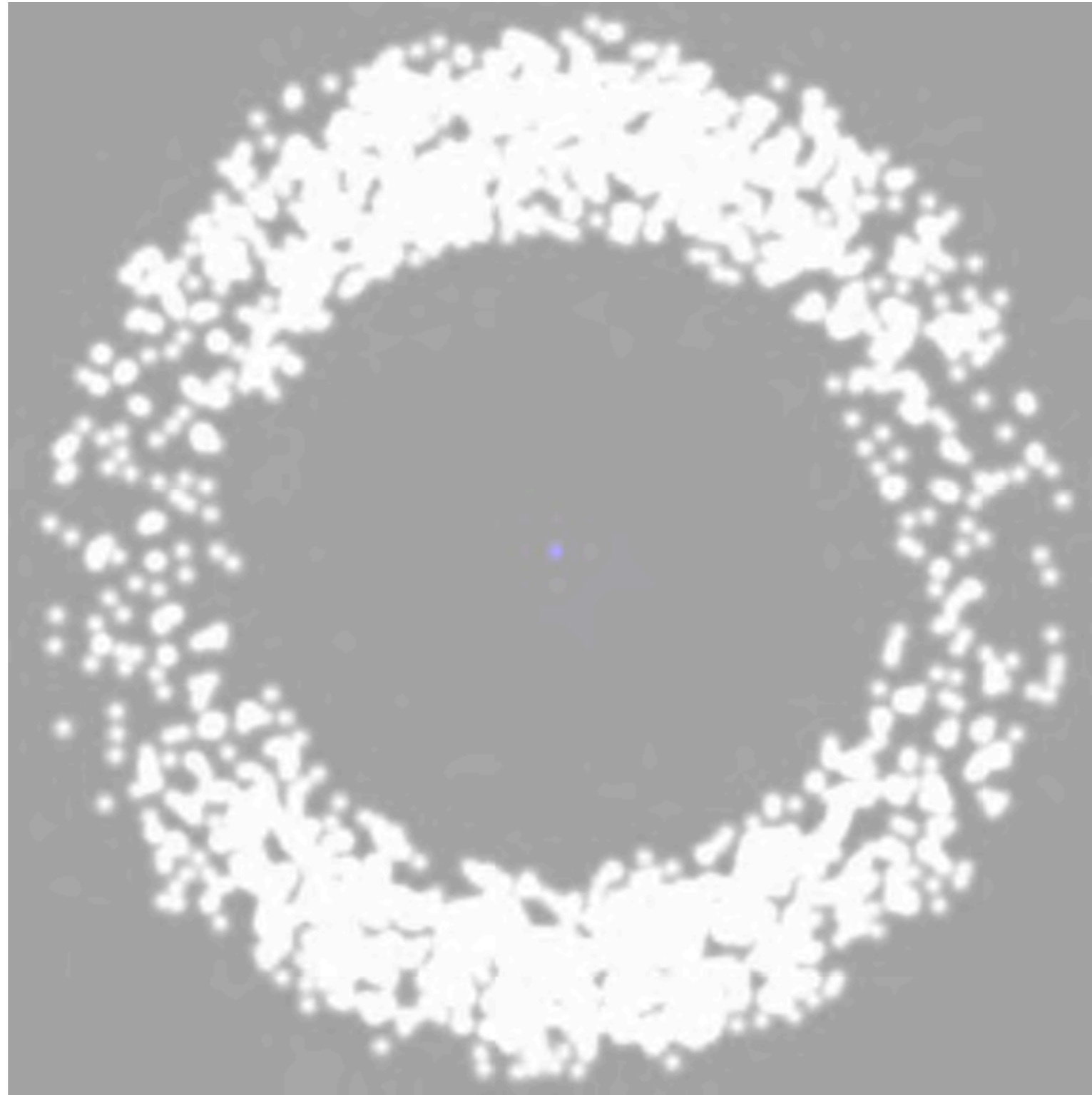
Keeping structural connectivity fixed (apart from scale factor), emerging global dynamics predicts functional connectivity N^2 .

2a. Multi-stable perception: characterizing collective stable states

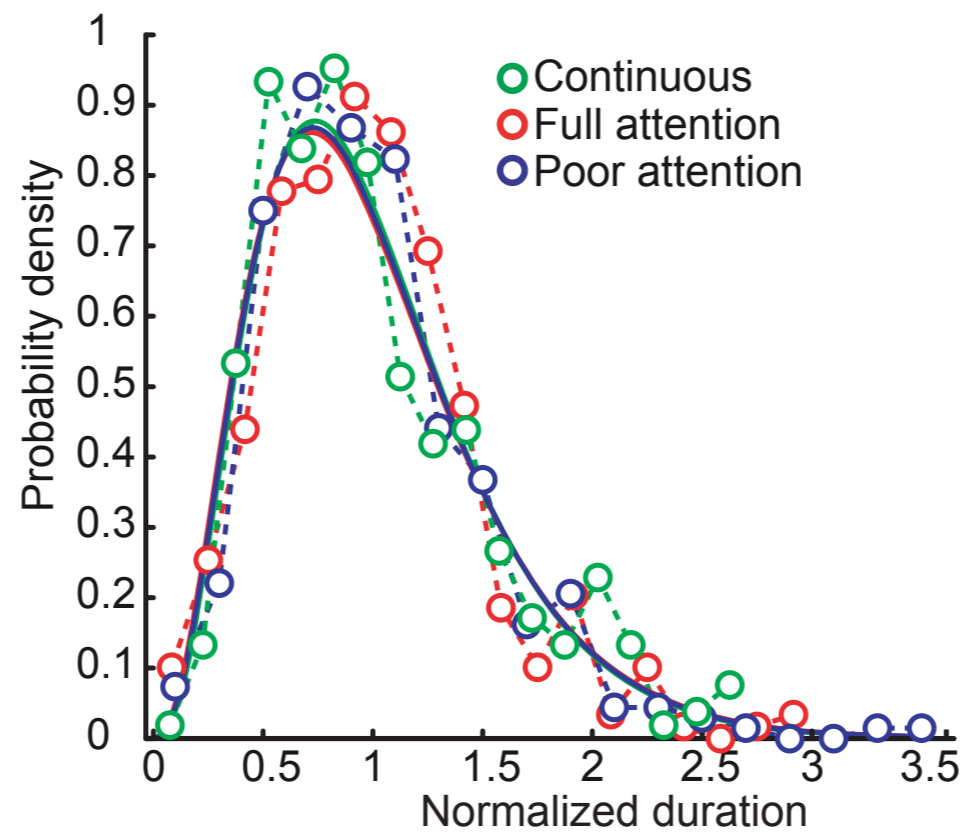
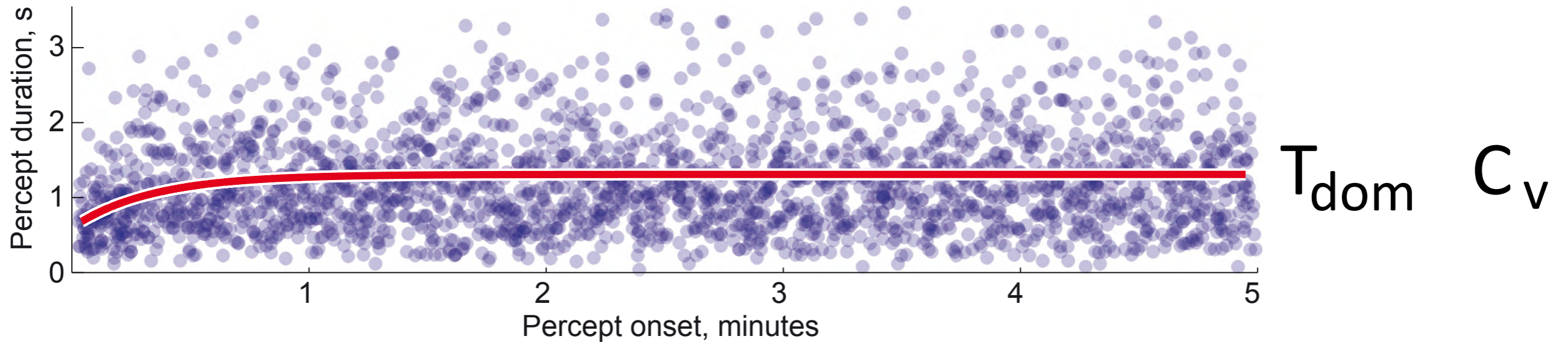
Pastukhov, Garcia-Rodriguez, Haenick, Guillamon, Deco, Braun
(2012) Front. Comp. Neurosci.

Kinetic depth effect

Wallach, O'Connell, 1953



Distribution of dominance periods

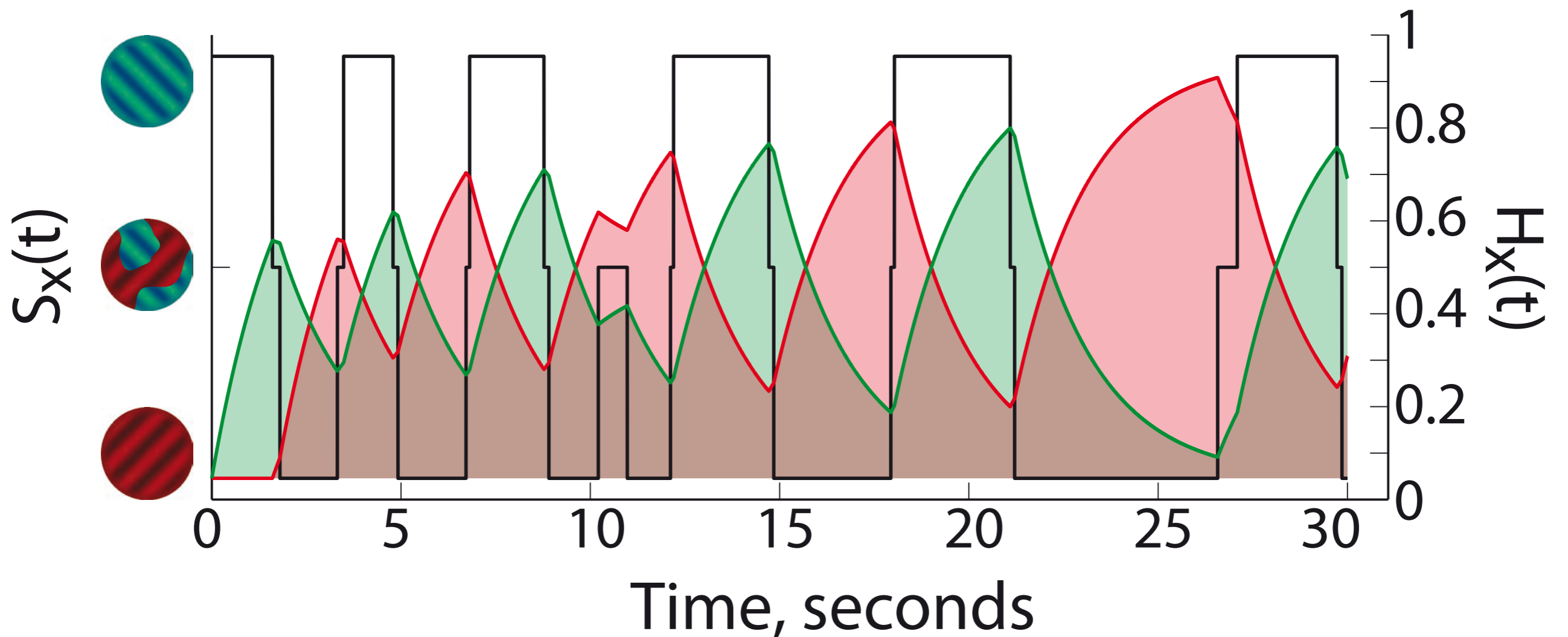


Cumulative history

$S_x(t)$ perceptual appearance

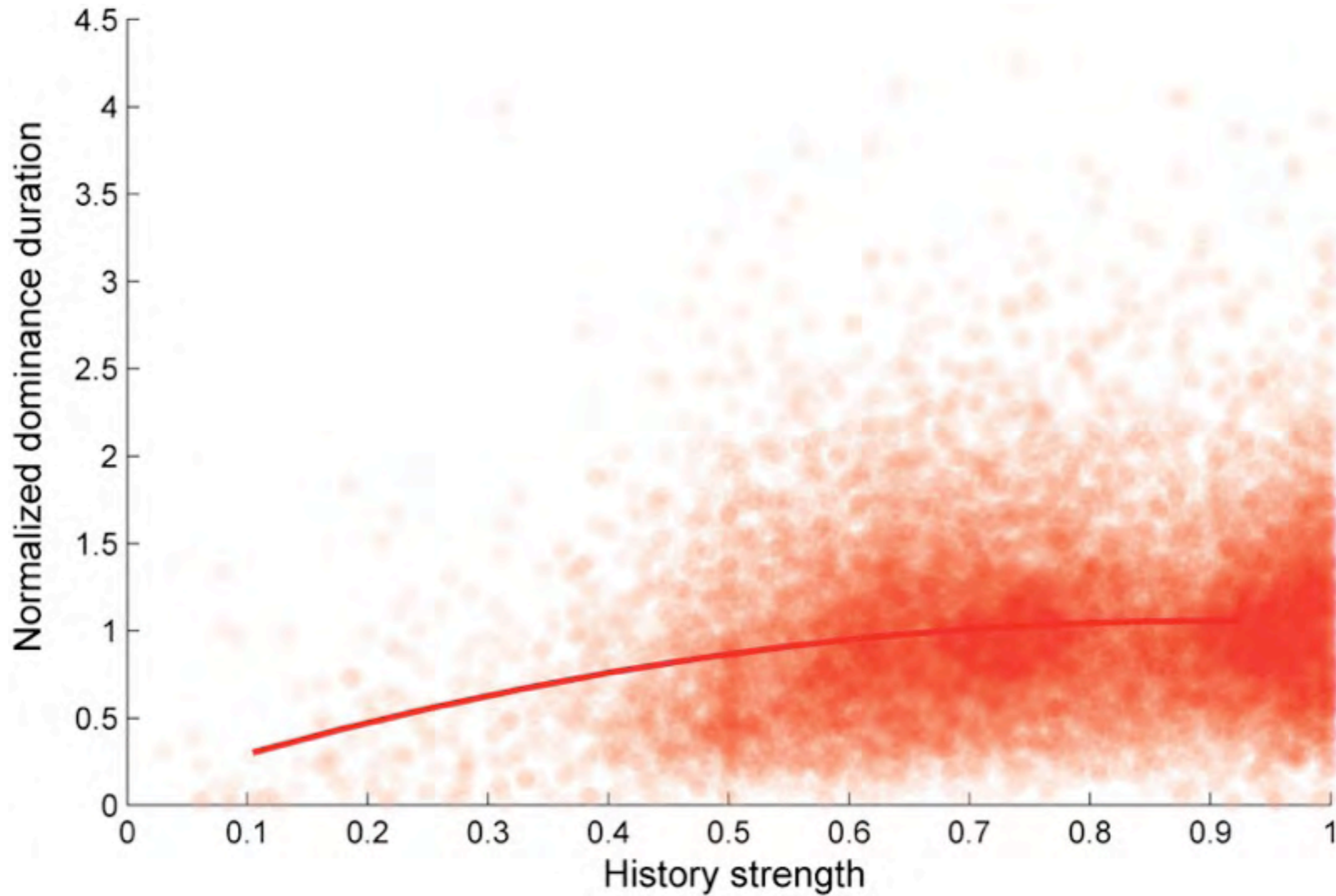
$H_x(t)$ leaky integrator of appearance with time constant τ_H

Pastukhov, Braun (2010) Journal Vision 10(11): 12



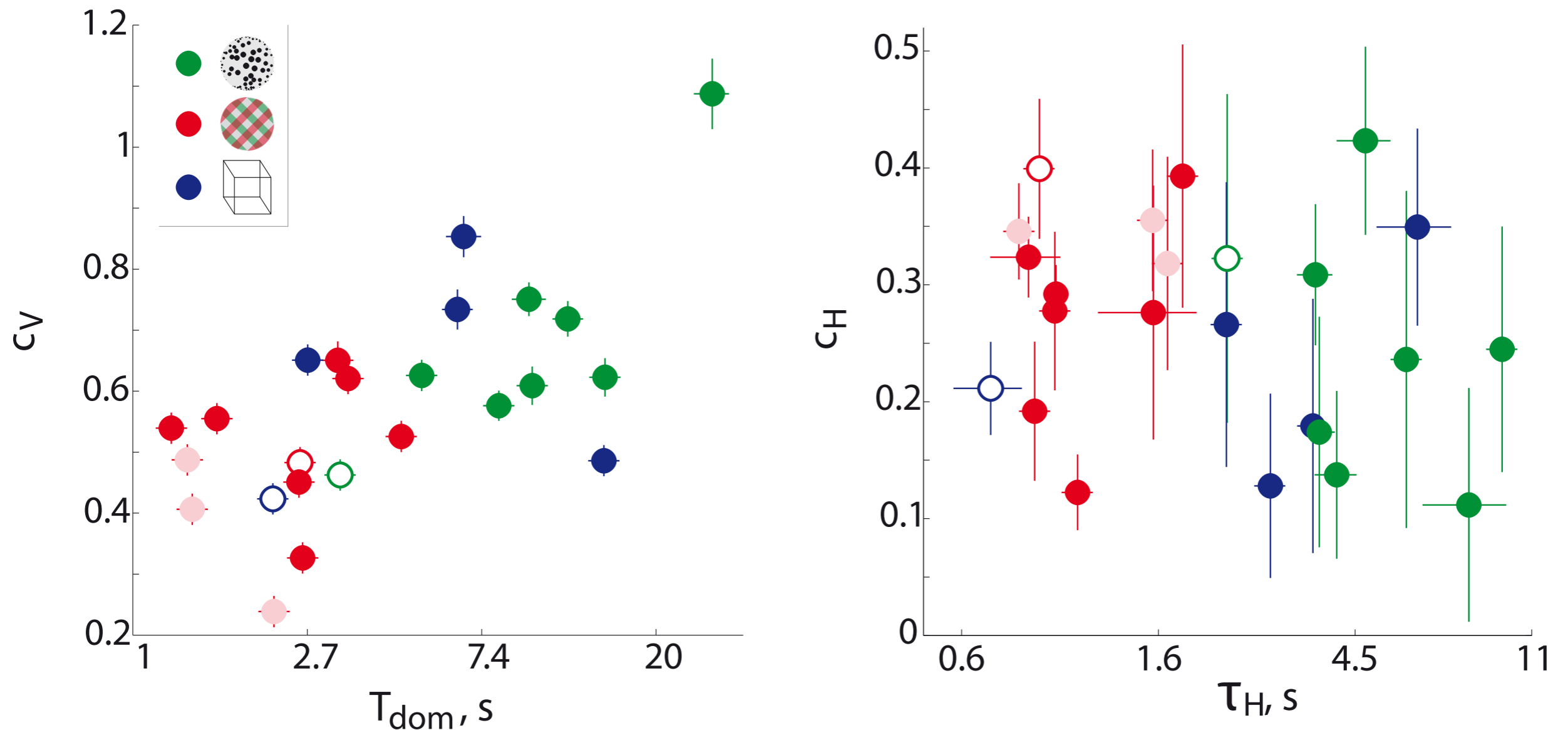
Cumulative history

C_H τ_H



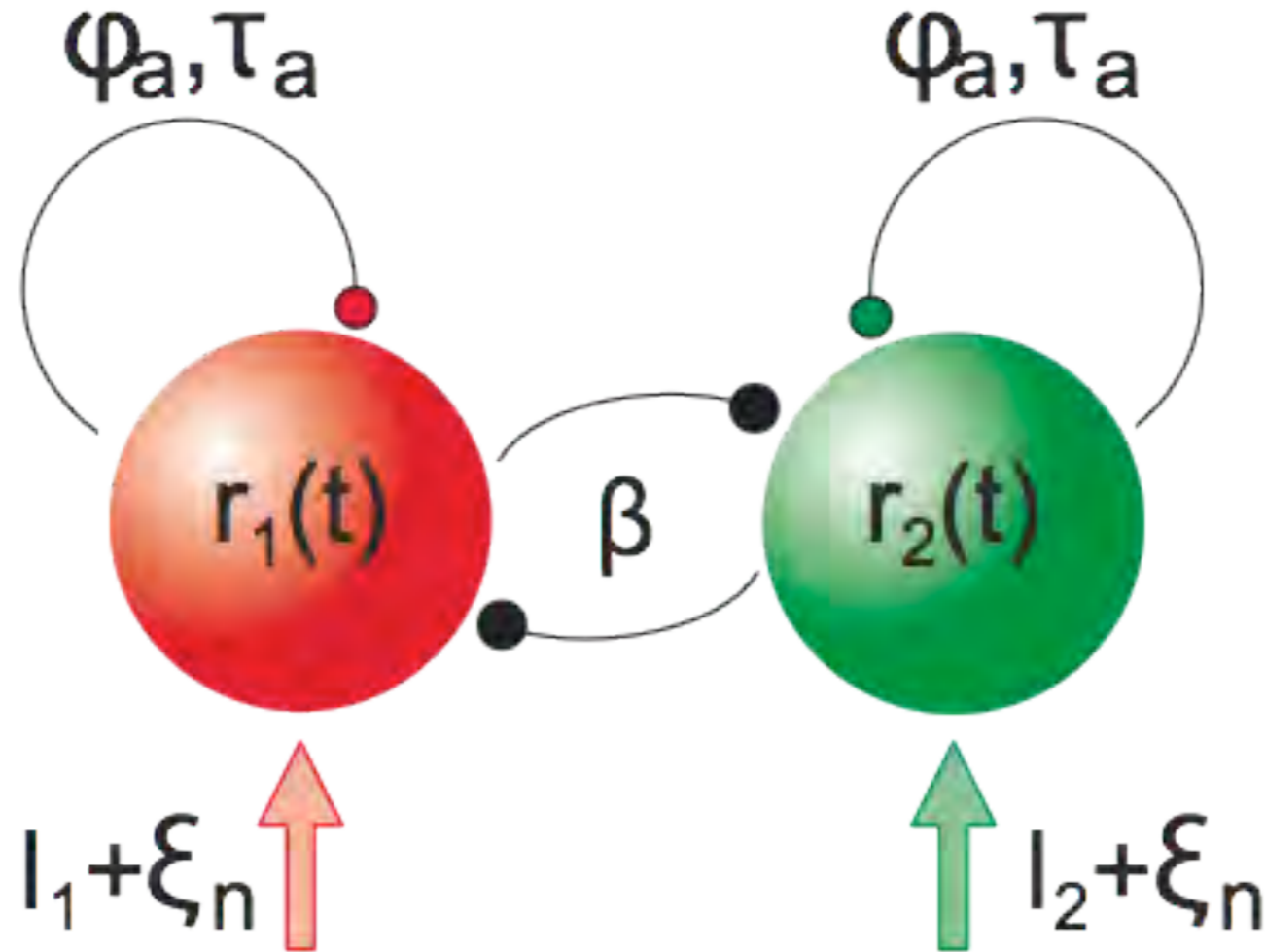
The superficial diversity

Individual statistical measures vary widely between observers and displays. Superficially, the perceptual dynamics is anything but consistent!



Balance of competition, adaptation, and noise

A simple model generates a continuum of possible dynamics, which are parametrized by competition β , adaptation ϕ_a , and signal-to-noise ratio I_0

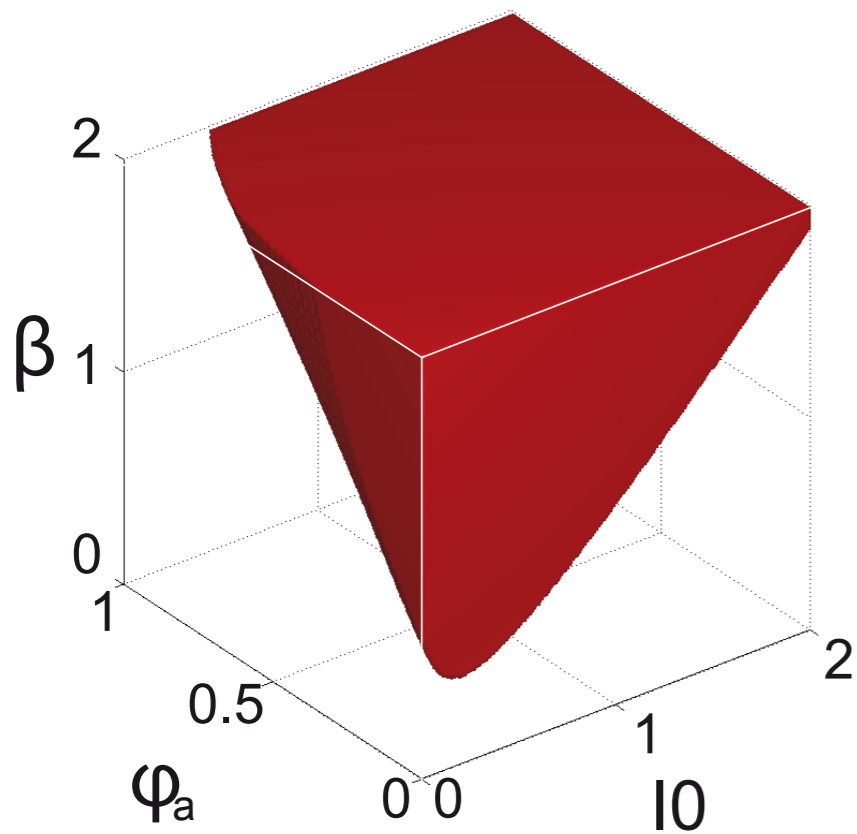


Laing, Chow (2002) Journal Computational Neuroscience 12(1): 39-53.

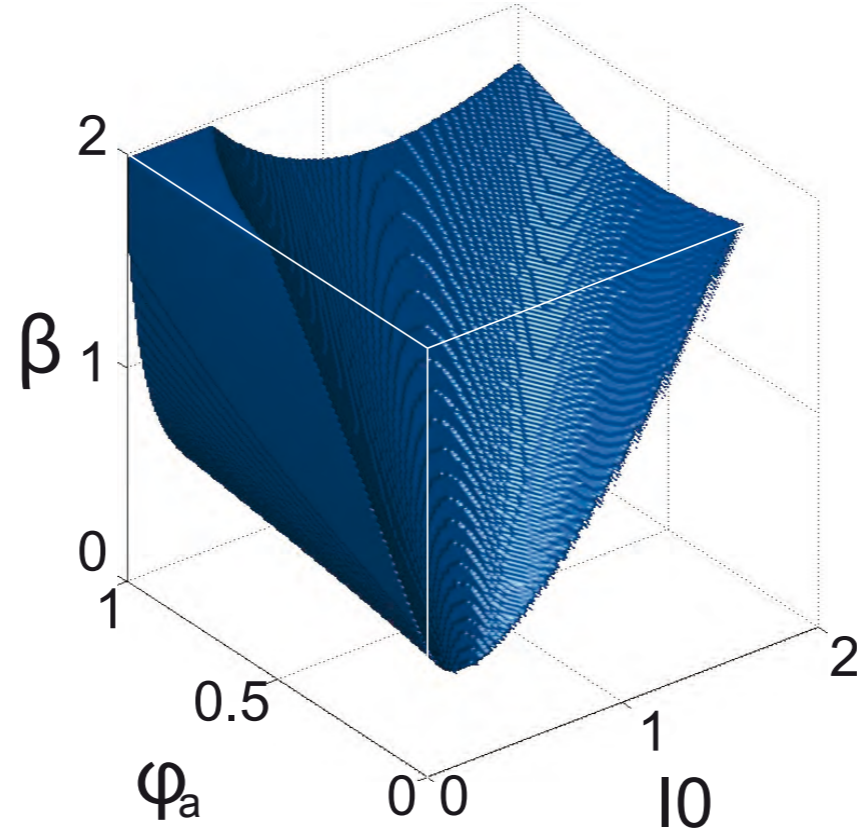
Dynamical regimes I

Different combinations of competition β , adaptation ϕ_a , and signal-to-noise ratio I_0 produce different kinds of reversal sequences.

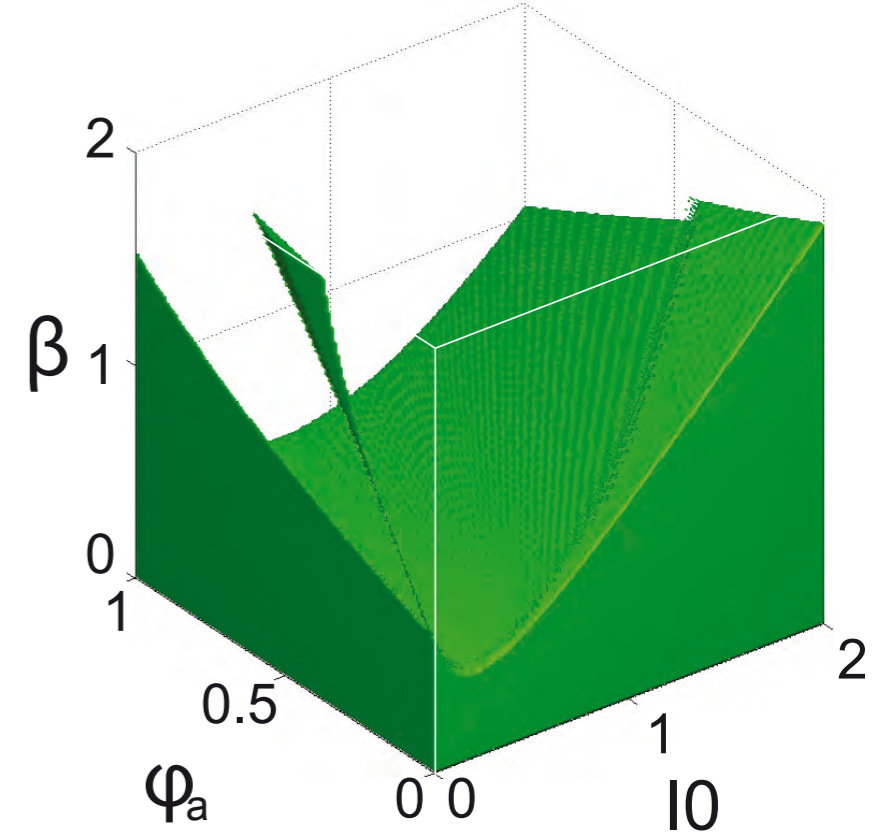
Bistable region



Oscillatory regime

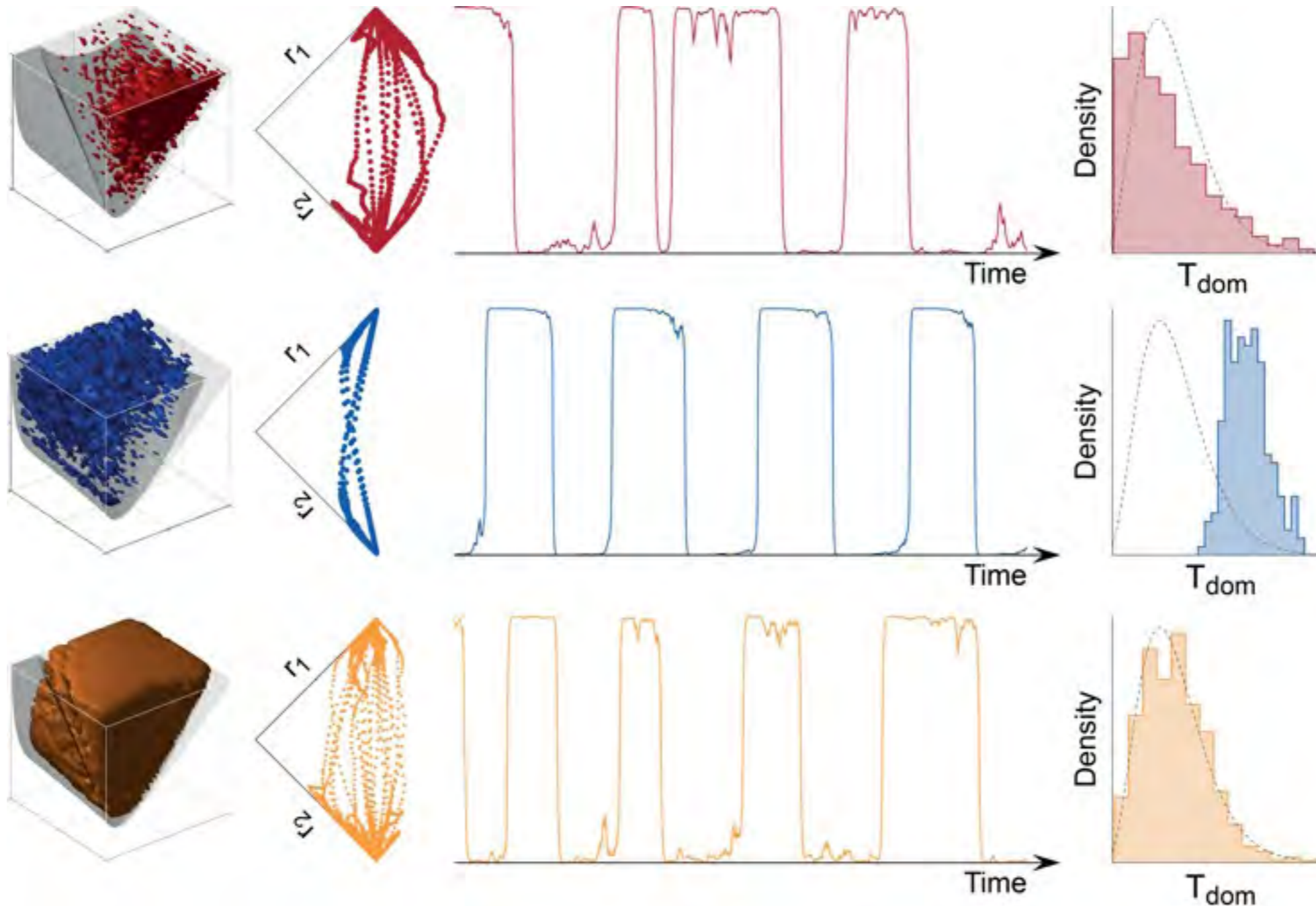


Stationary regime



Dynamical regimes II

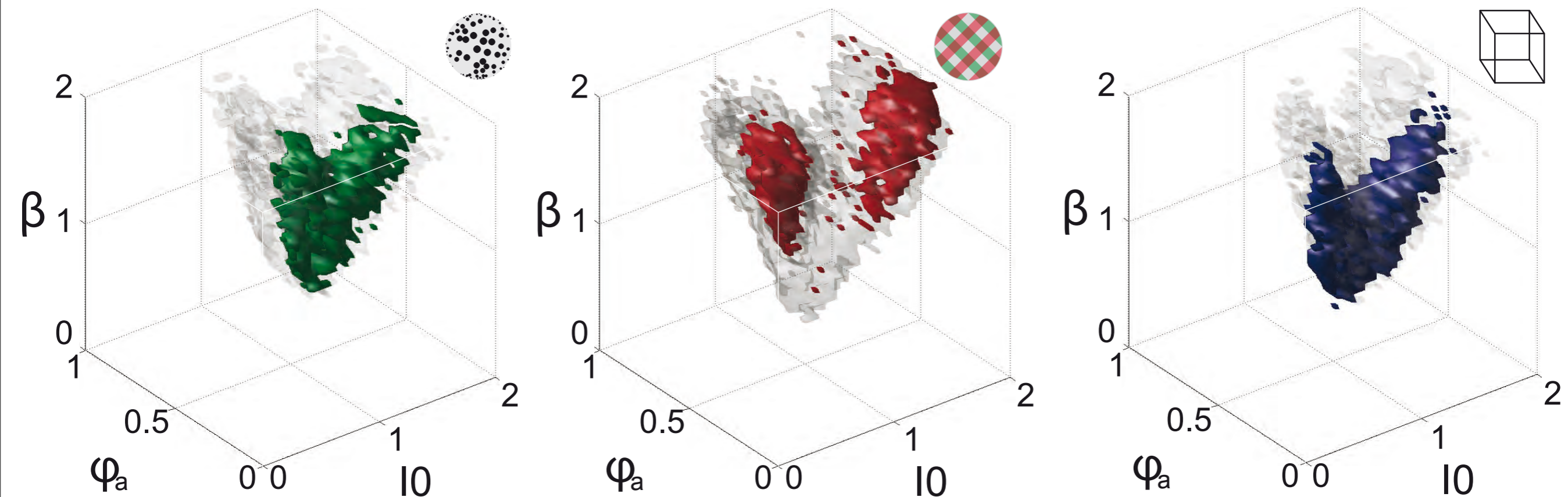
Formally, distinguish "bistable" and "oscillatory" regimes. Human observers typically fall between these extremes.



Pastukhov, et al. (2013) *Frontiers in Comp Neuroscience*

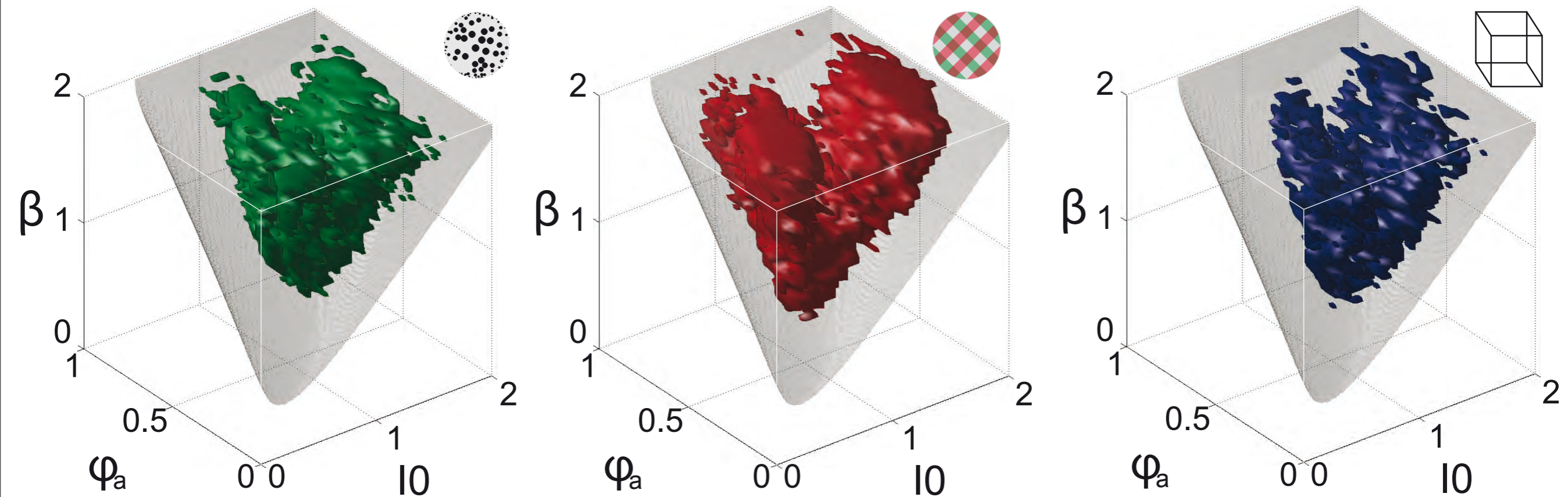
Individual observer "operating regime"

Small volumes reproduce dominance distribution & history dependence of individual human observers: $\sim 3\%$ of possible parameter space.



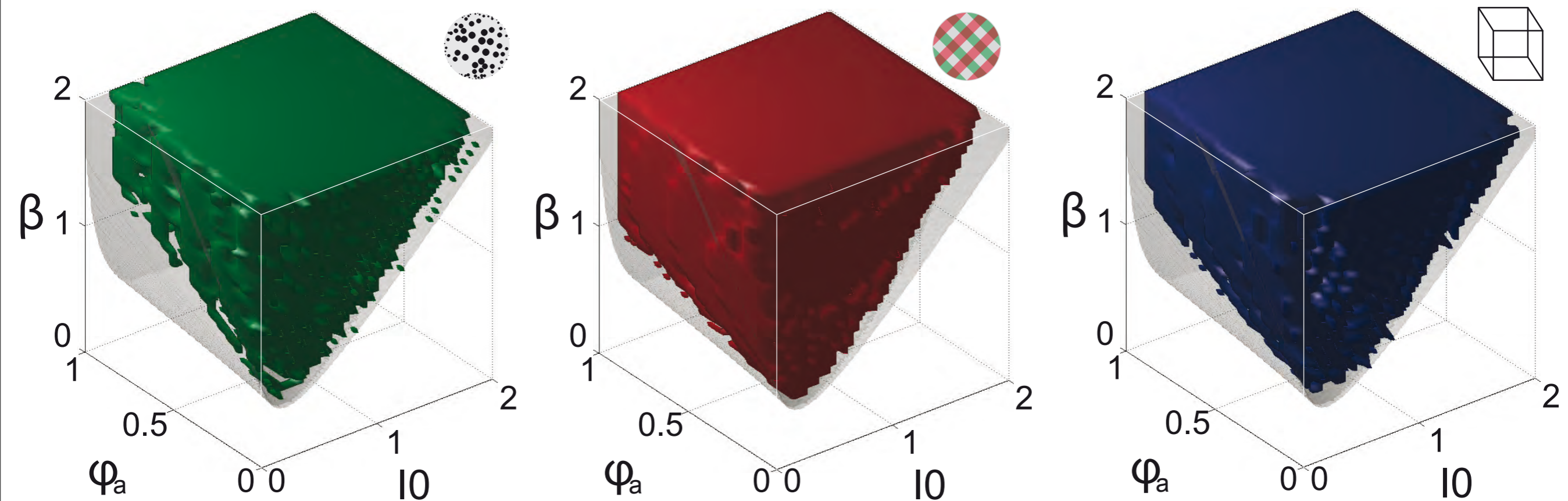
The hidden consistency I

Union of "operating regimes" of all observers, $\sim 15\%$ of possible parameter space. Clustering is significant $p < .02$

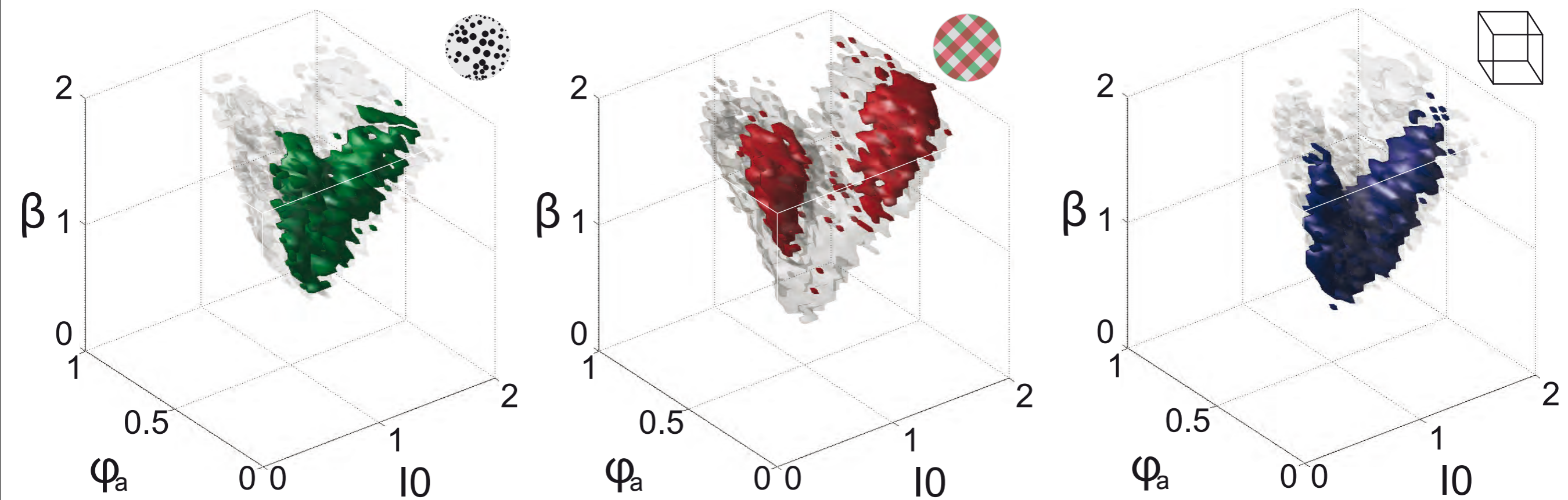


The hidden consistency II

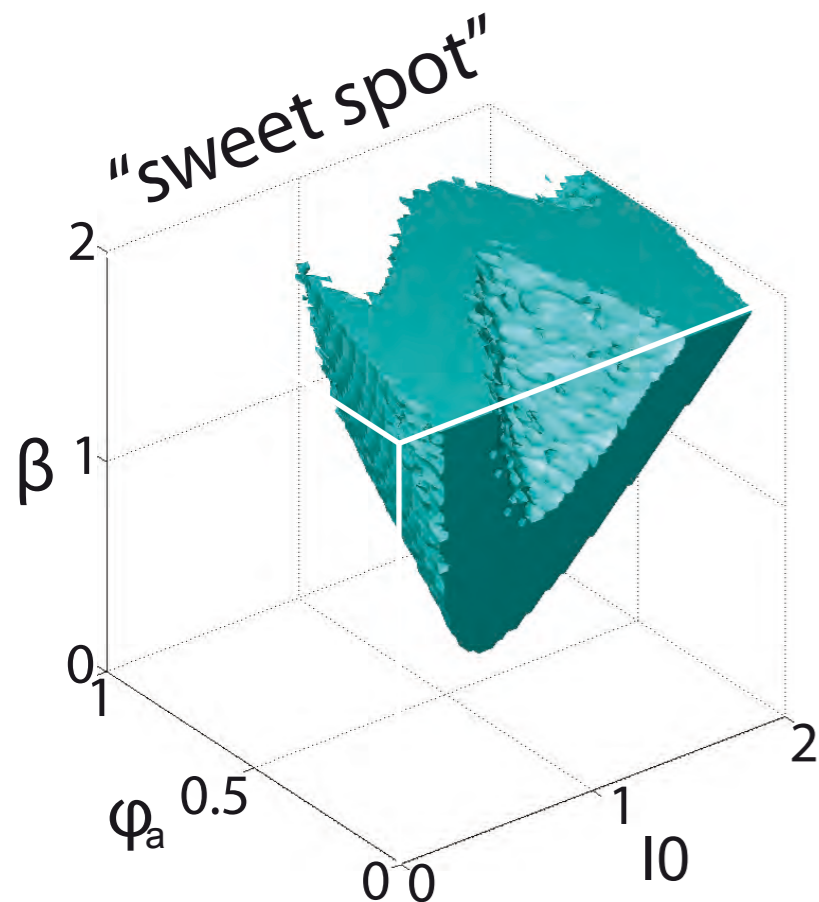
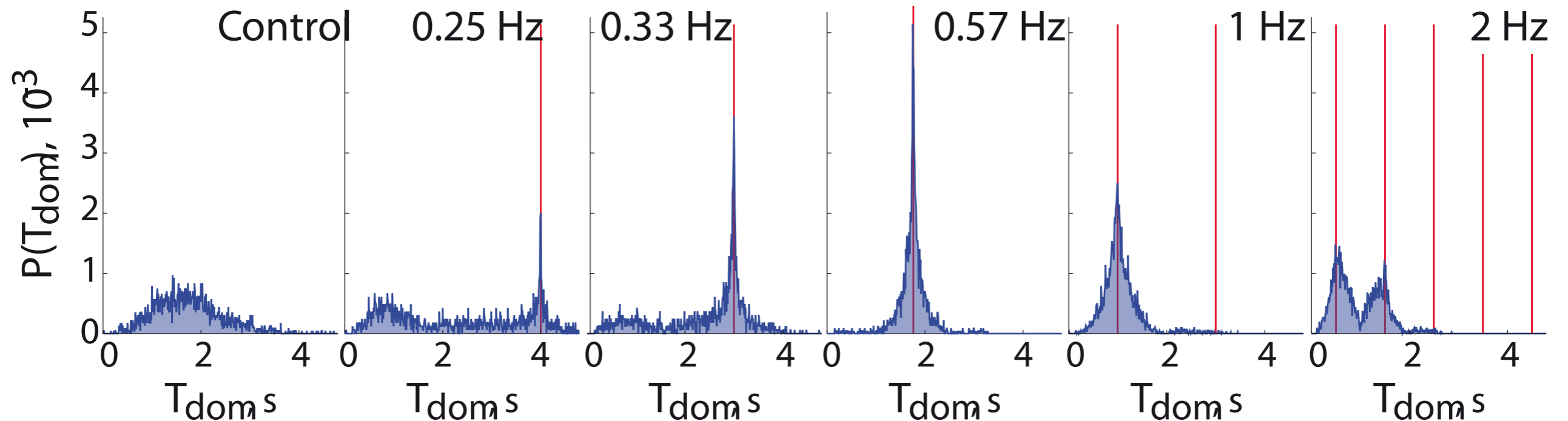
Region matching only dominance distribution (not history dependence) of all observers: $\sim 75\%$ of possible parameter space.



Why operate in a particular regime?

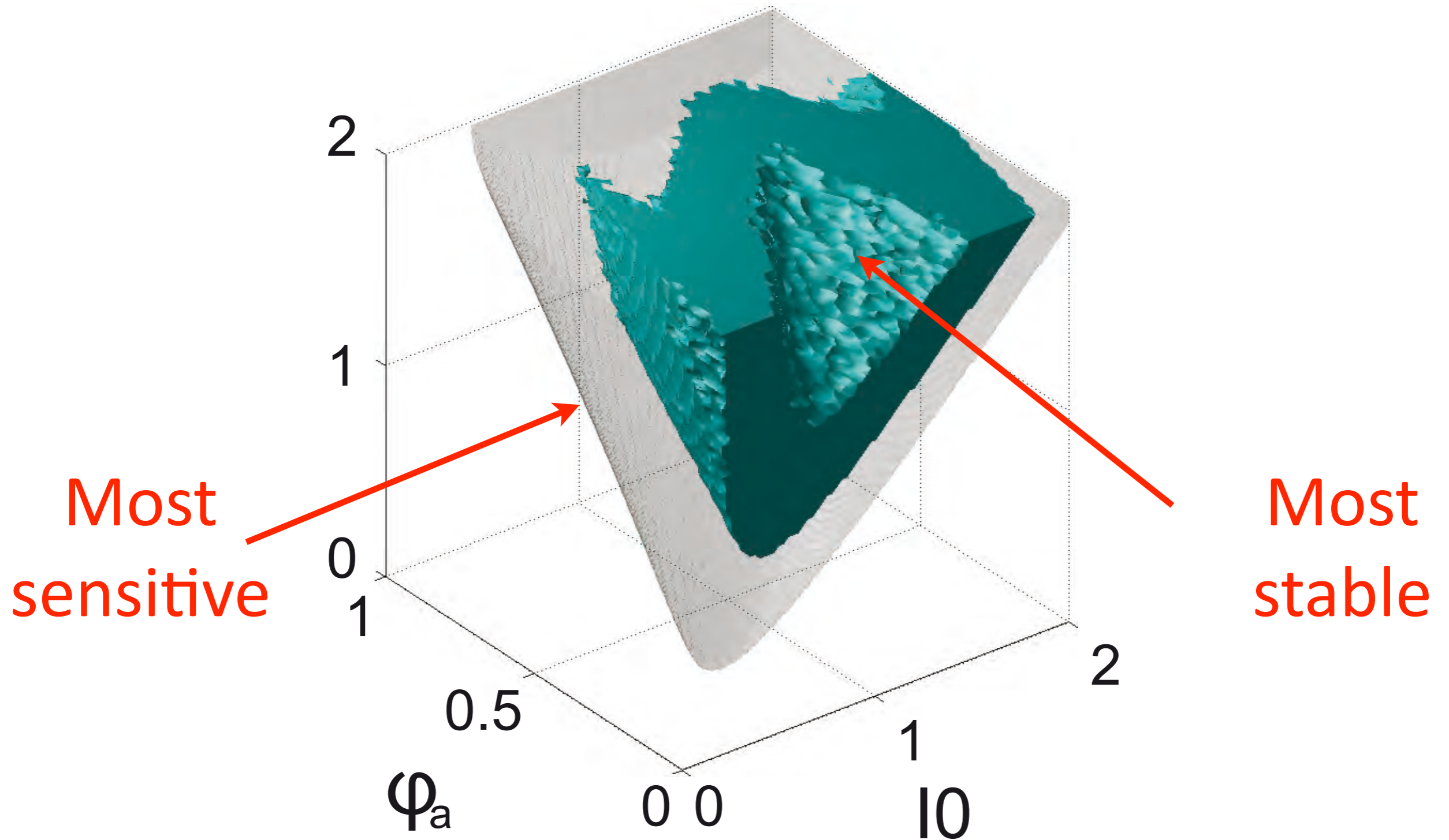


Functional 'sweet spot'



Theory predicts a functional 'sweet spot' which balances stability (dominance time) against sensitivity (here: frequency resonance).

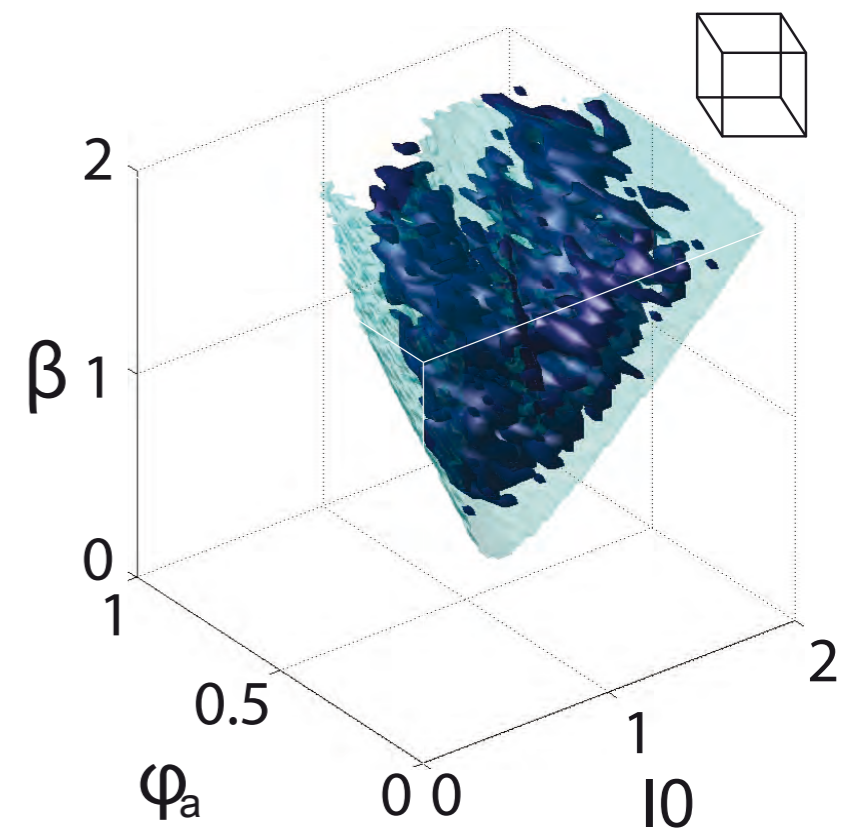
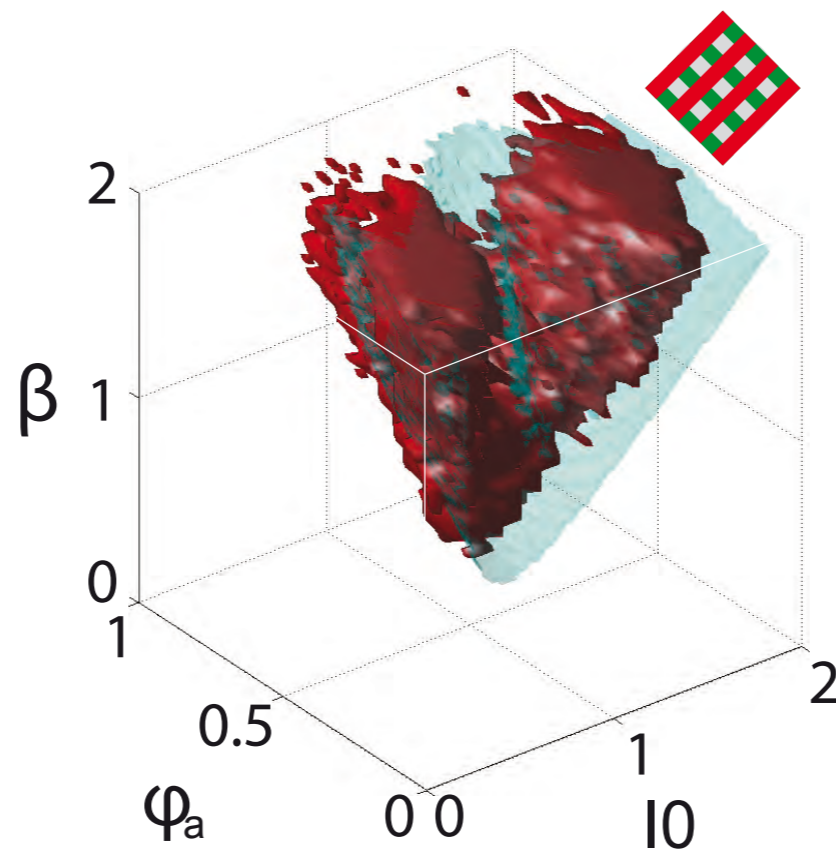
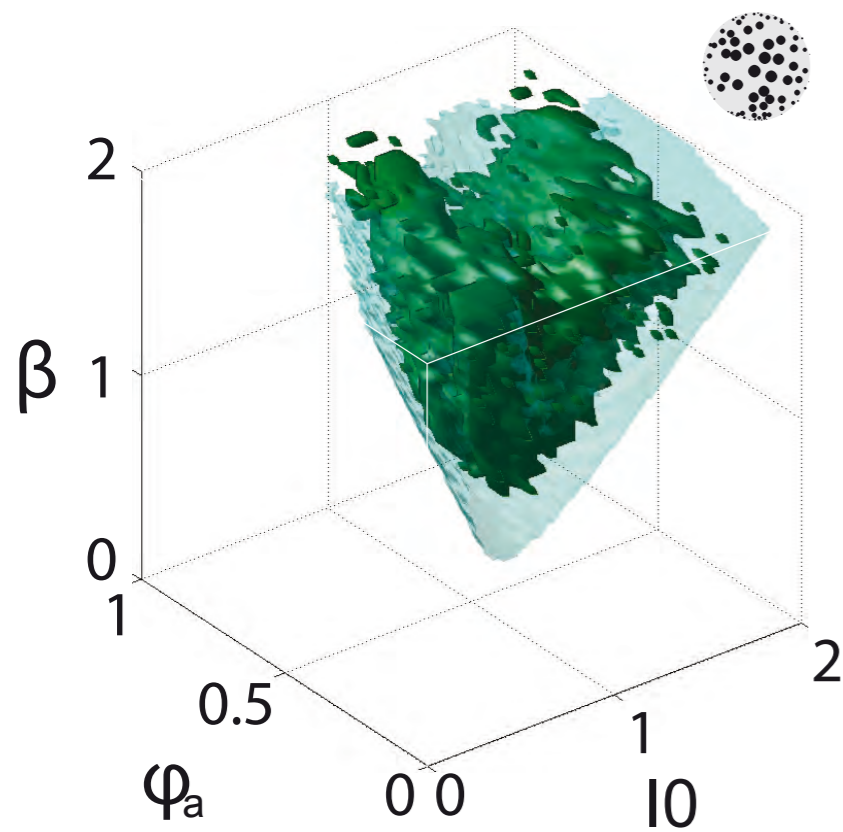
Functional 'sweet spot'



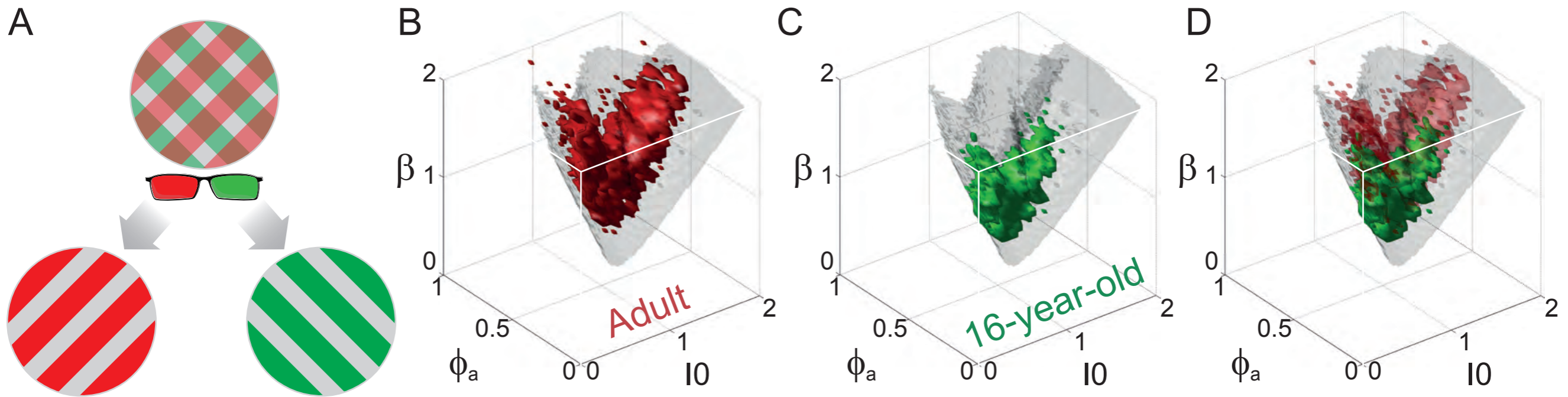
'Sweet spot' near, but not at, bifurcation surface
(= boundary between bistable and oscillatory regimes)

Balance of stability and sensitivity

Humans operate in functional 'sweet spot' (cyan volume).

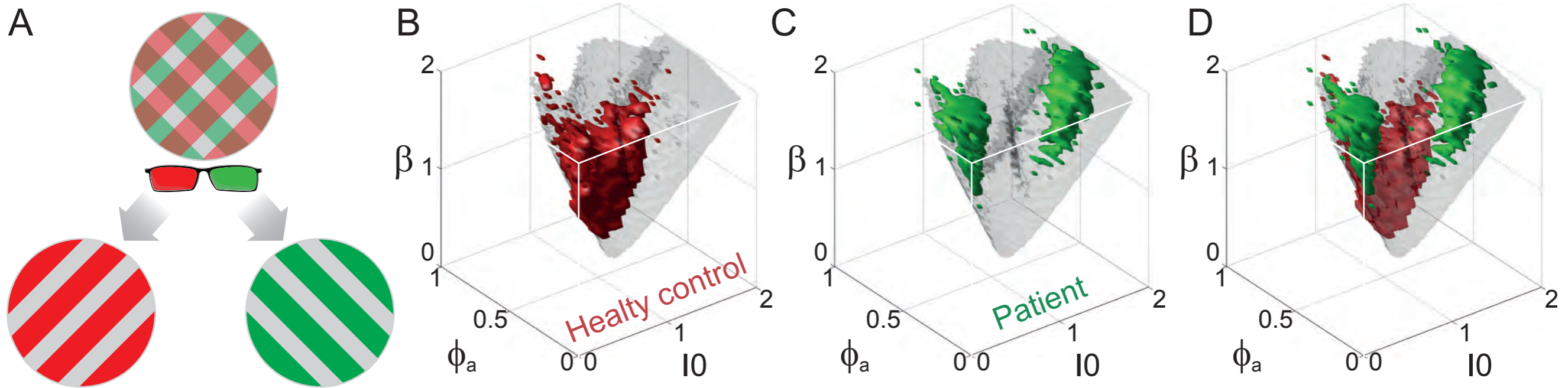


Comparing competition (vertical β -axis)



normal adults vs. 16-year olds
(with Ilona Kovacs, Budapest)

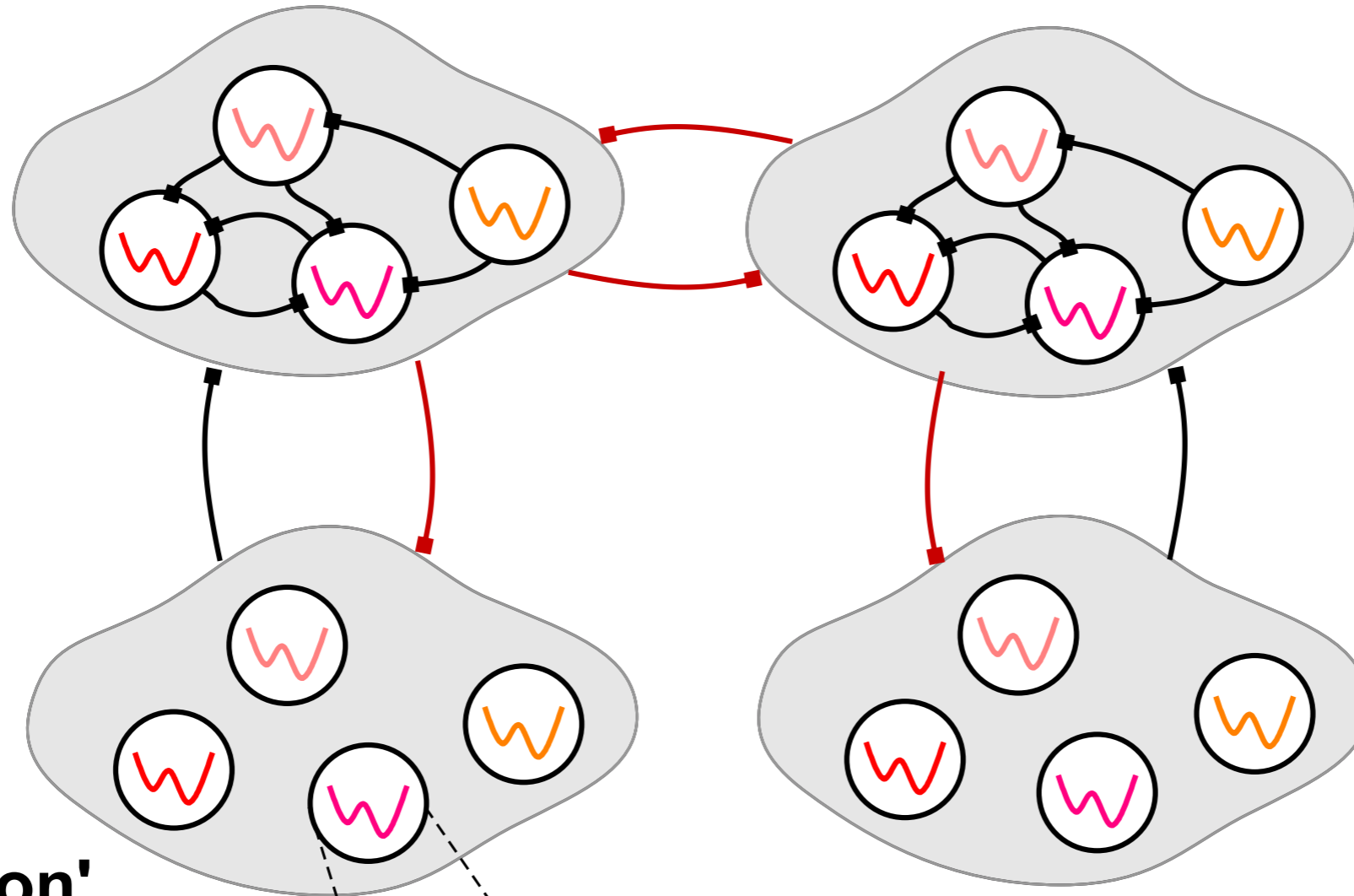
Comparing competition (vertical β -axis)



normal adults vs. anorexia nervosa
(with Ilona Kovacs, Budapest)

Two-level model

IPS
'limited capacity'



self
excitation,
competition

ff excitation
fb inhibition

VC
'evidence
accumulation'

stochastic
integration
to bound

Local
synaptic
feedback

Synaptic input
coding F

excitation

inhibition

All interactions determined by psychophysics

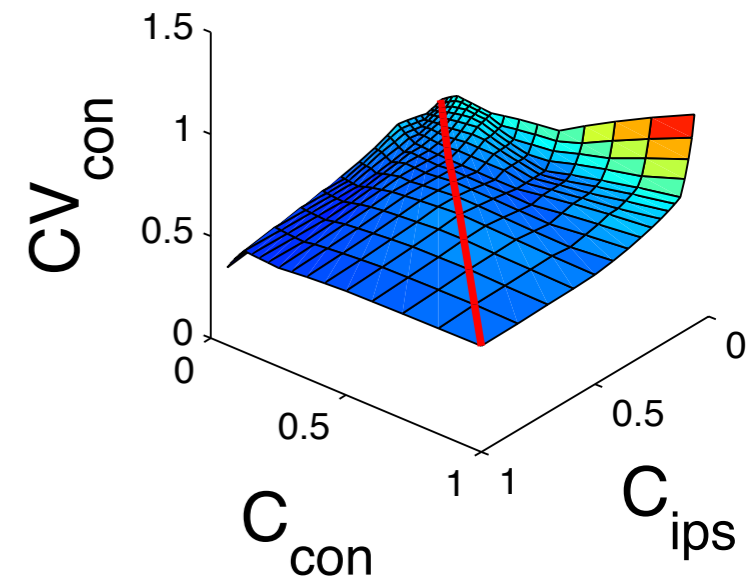
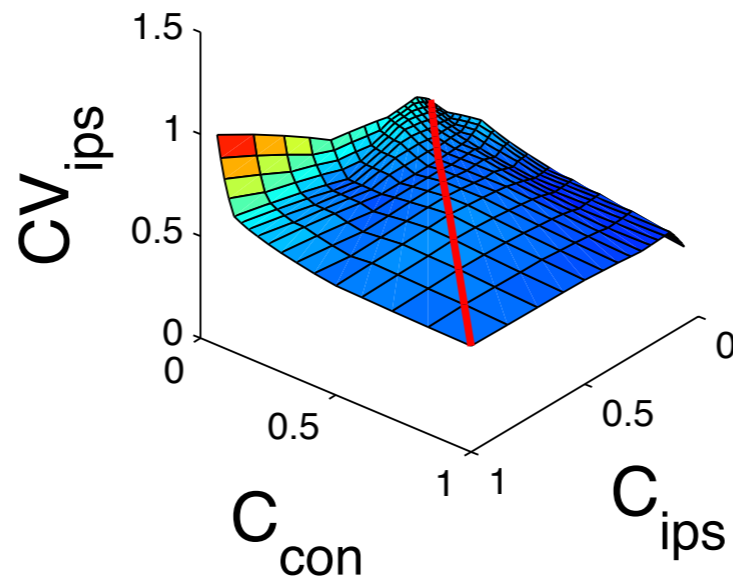
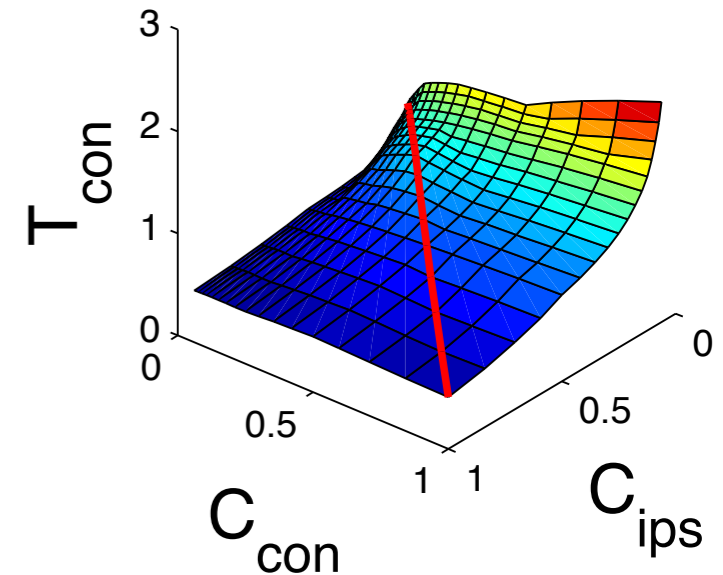
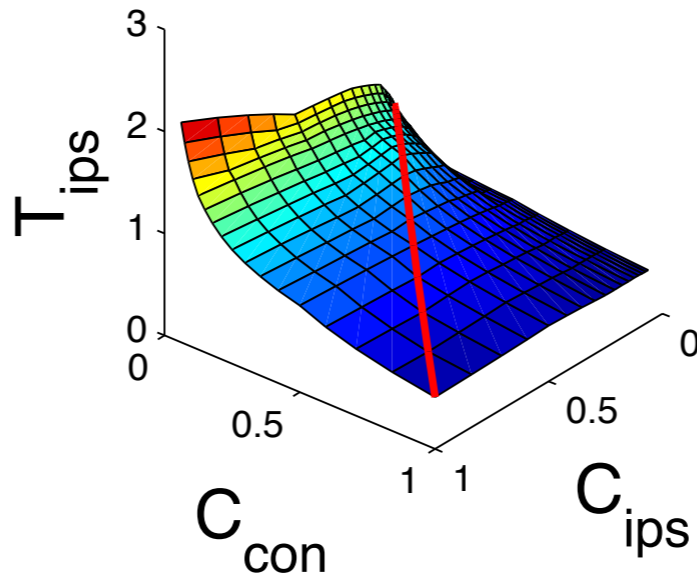
Levelt's propositions

Scalar law

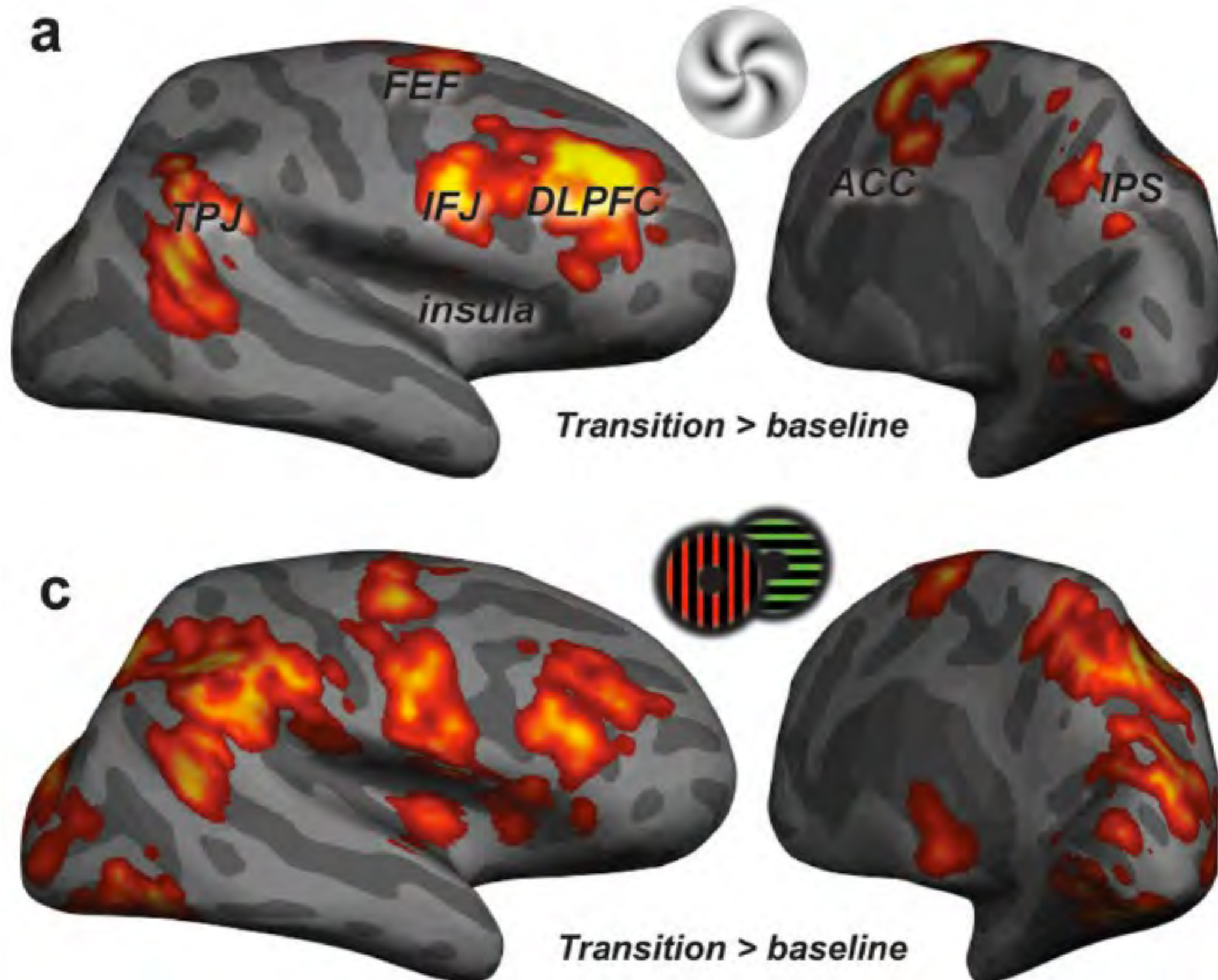
Perceptual adaptation

Flash suppression

Flash facilitation



Transition-related activations

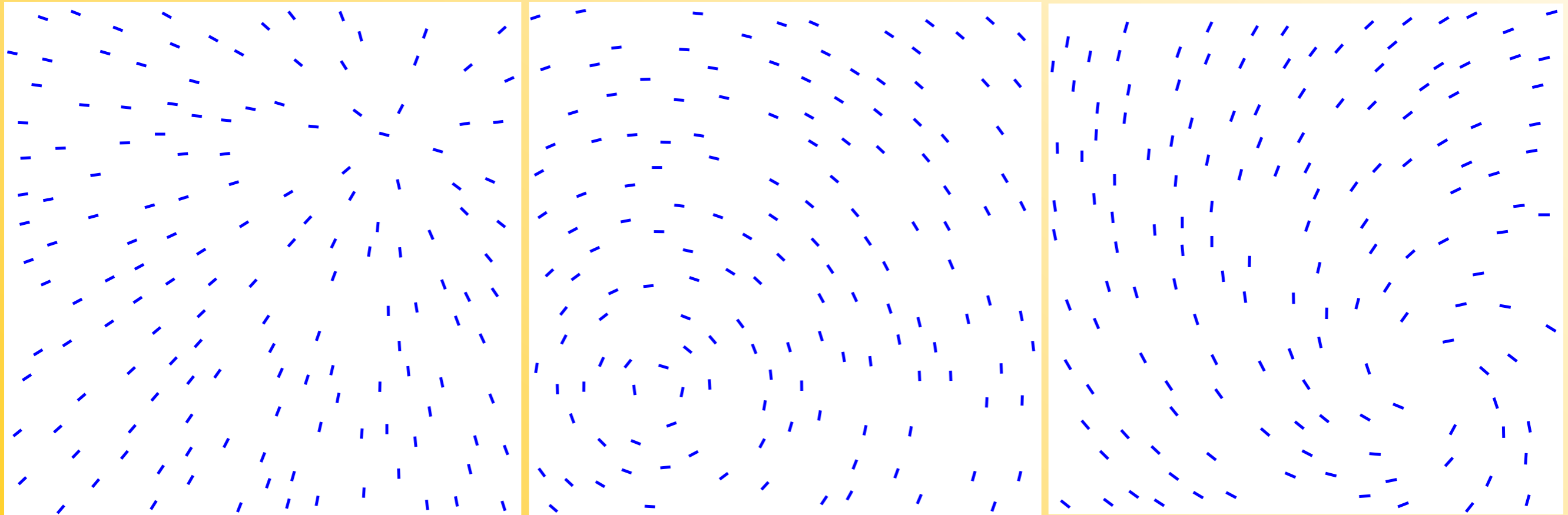


Knapen, Brascamp, et al. (2011) J Neurosci

2b. Perceptual organization: characterizing collective stable states

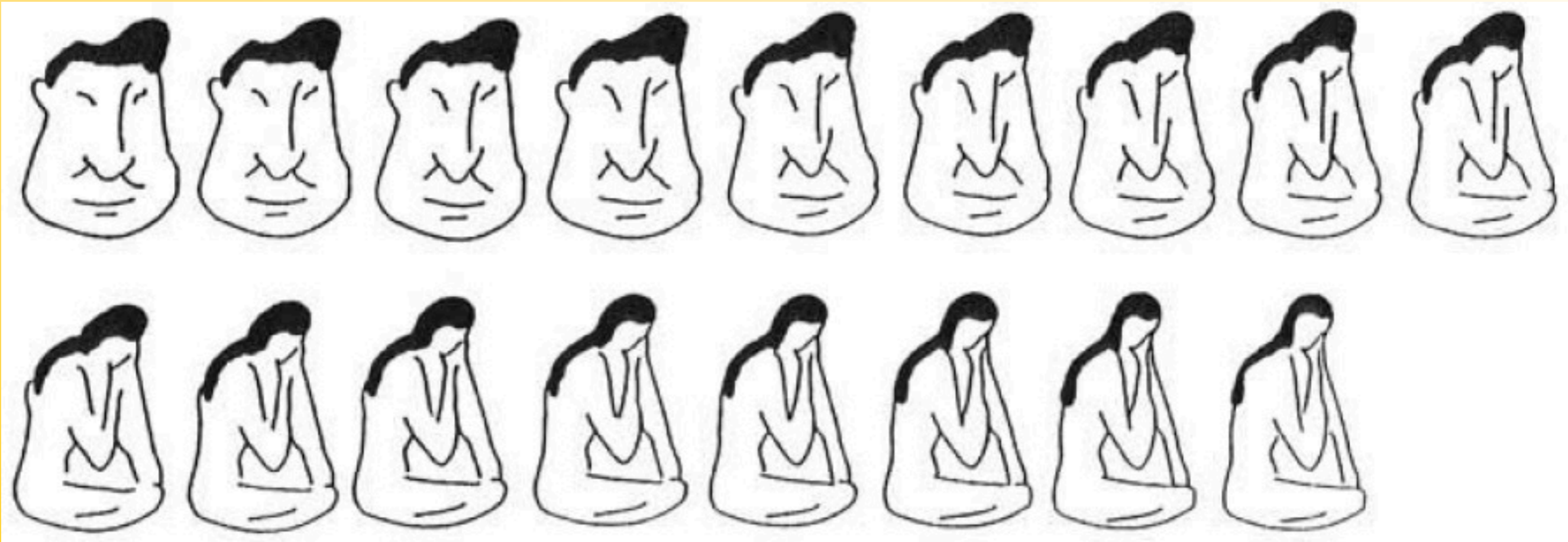
Aguilar, Mattia, Braun, in prep.

Perceptual organization is cooperative



Perceptual organization exhibits hysteresis

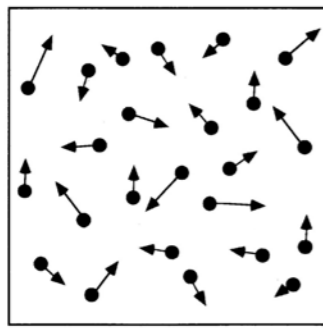
Chialvo, Apkarian, 1993



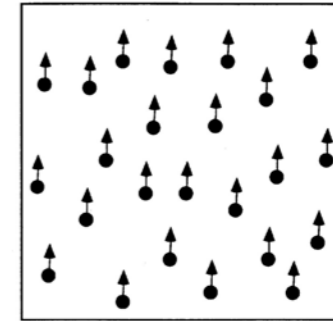
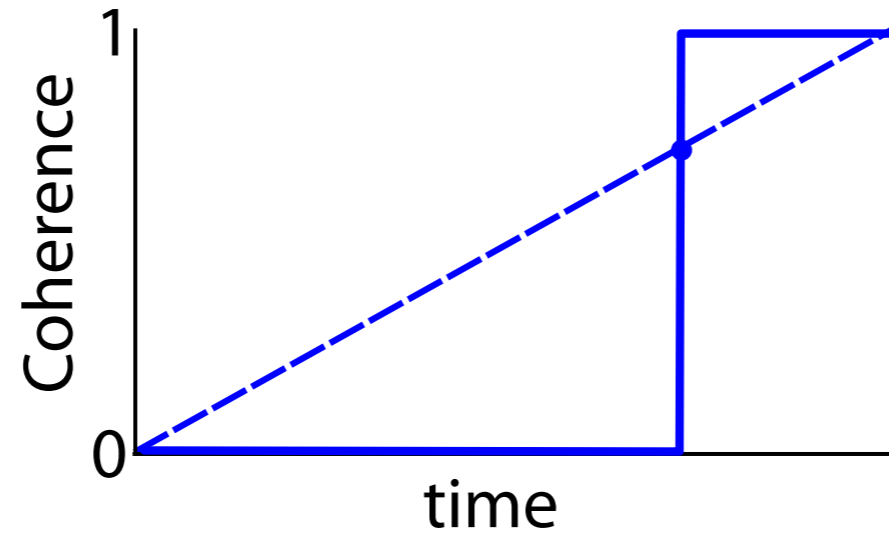
Motion-binding in RDK



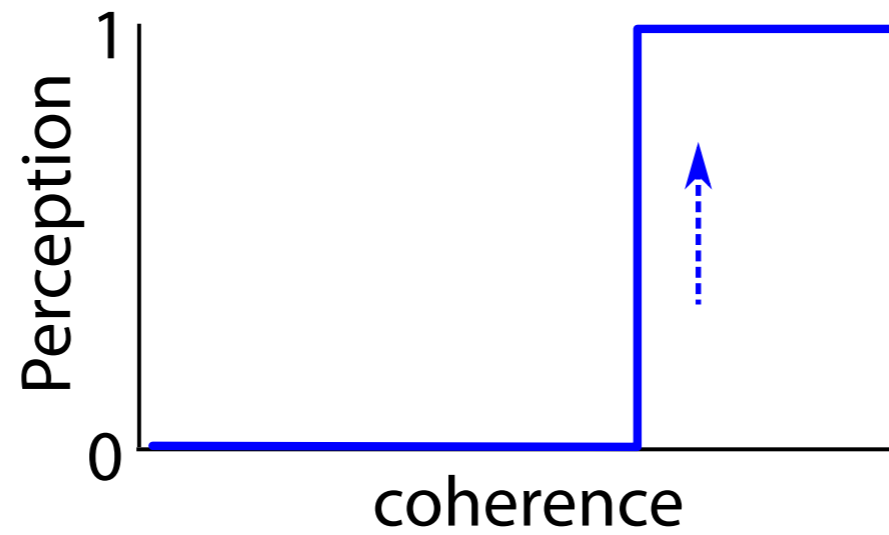
Ascending coherence



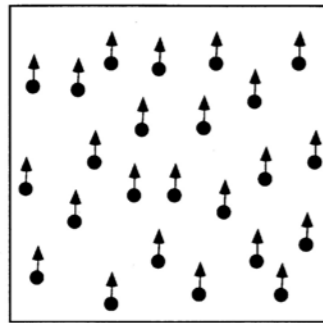
0% coherence



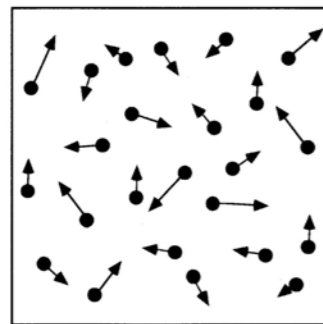
100% coherence



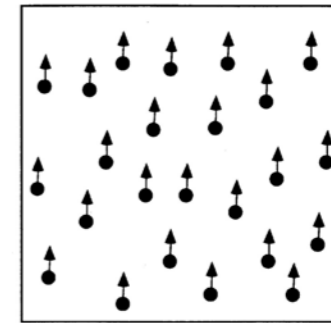
Descending coherence



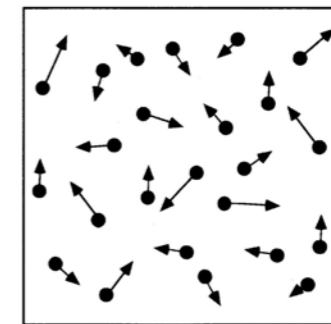
100% coherence



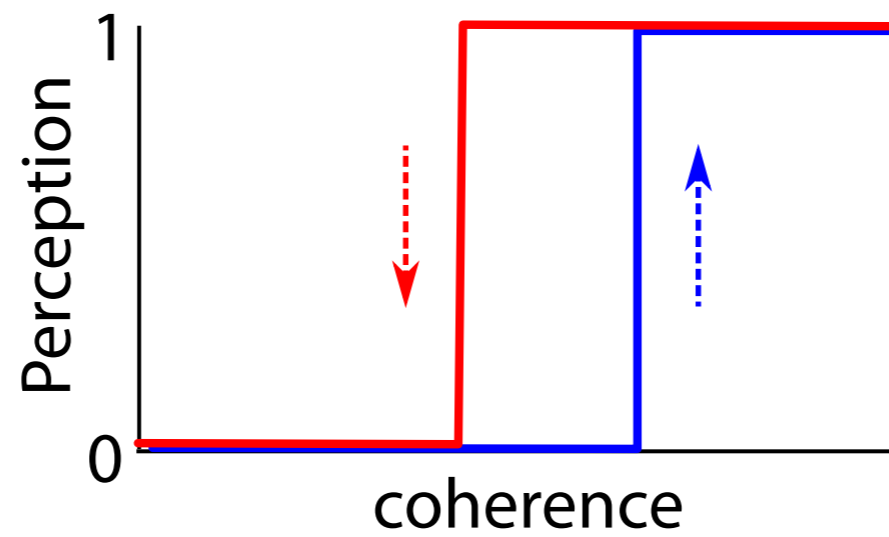
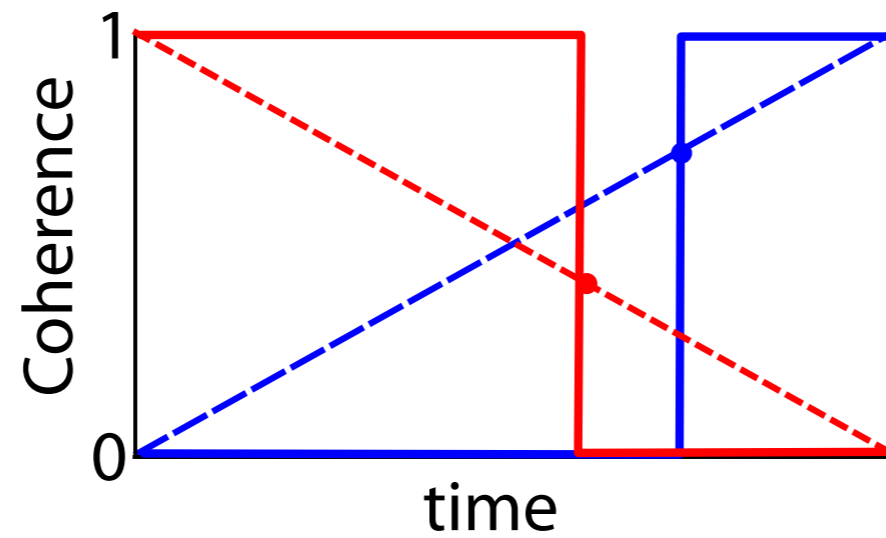
0% coherence



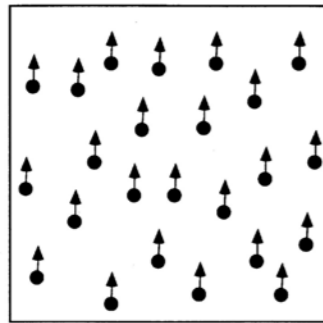
100% coherence



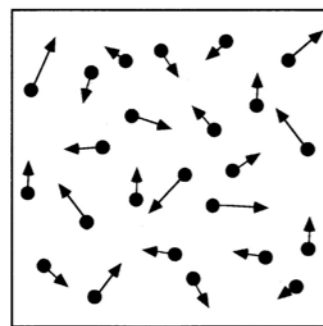
0% coherence



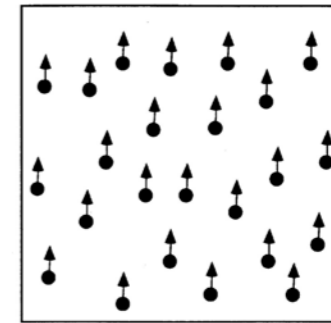
Hysteresis loop



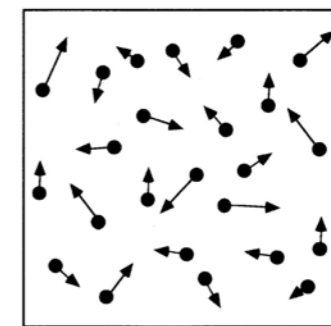
100% coherence



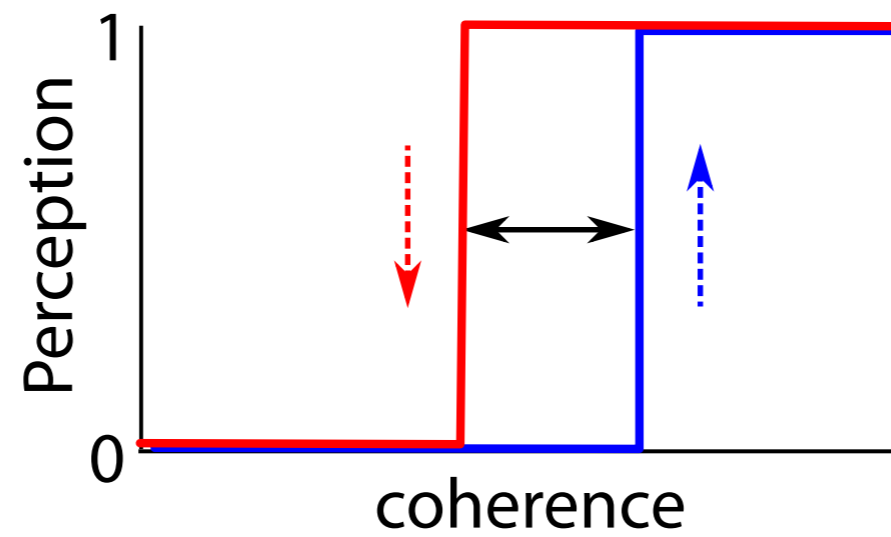
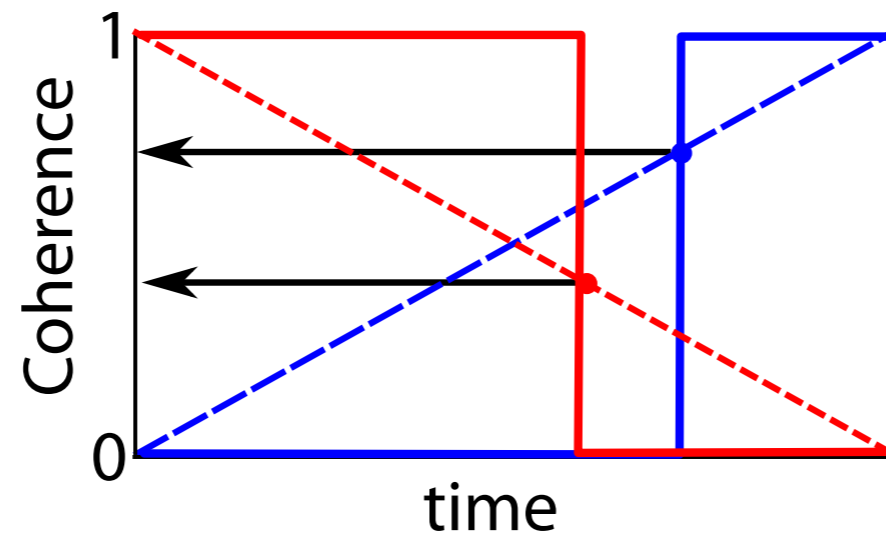
0% coherence



100% coherence



0% coherence

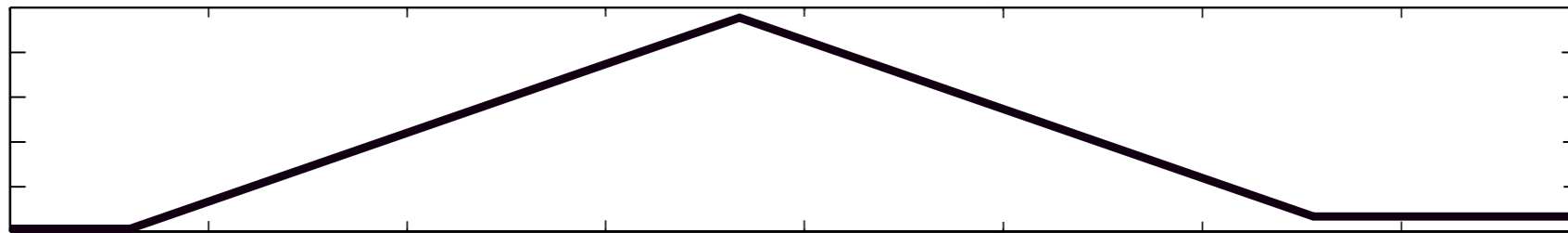
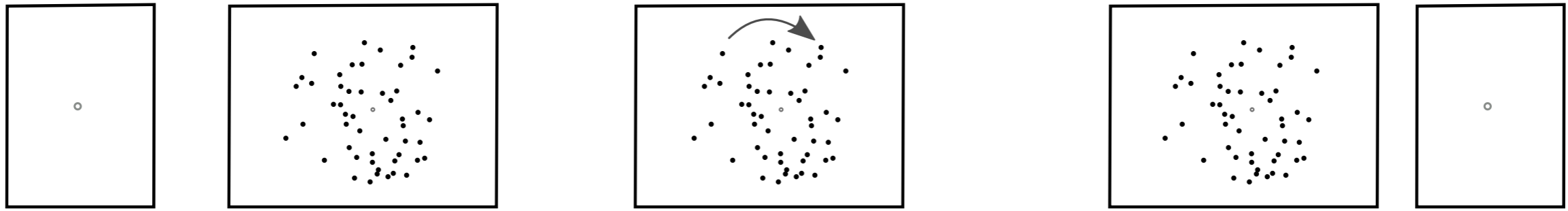


RDK

Fixation

with ascending and descending coherence

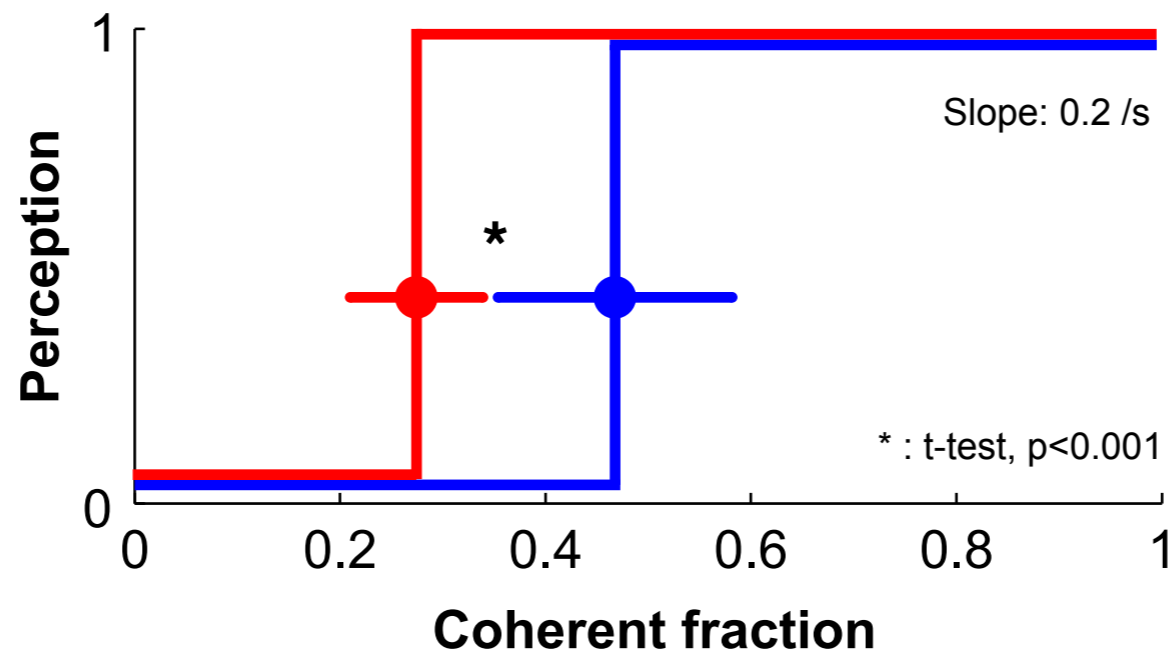
Fixation



Report ————— // ————— Report

↑
Rotation

↑
No rotation

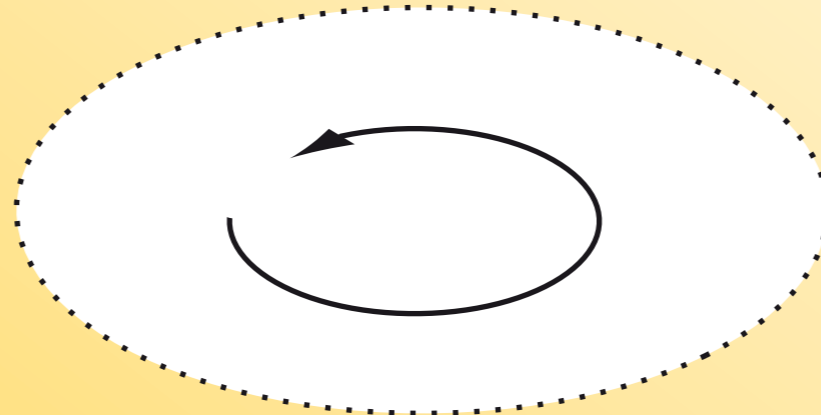


Hysteresis may reflect attractor dynamics of recurrently connected representation

- Evidence for cooperativity (Williams, Phillips, Sekuler, 1986).
- Evidence for stochastic dynamics (Chialvo, Apkarian, 1993).
- Stereopsis and binocular rivalry (Buckthorpe, Kim, Wilson, 2008).
- Qualitative model (You, Meng, Huan, Wang, 2010).

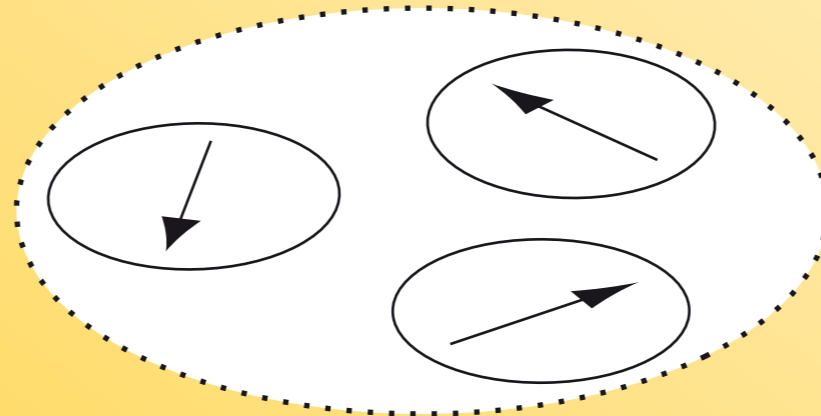
Presumed cortical representation

MST



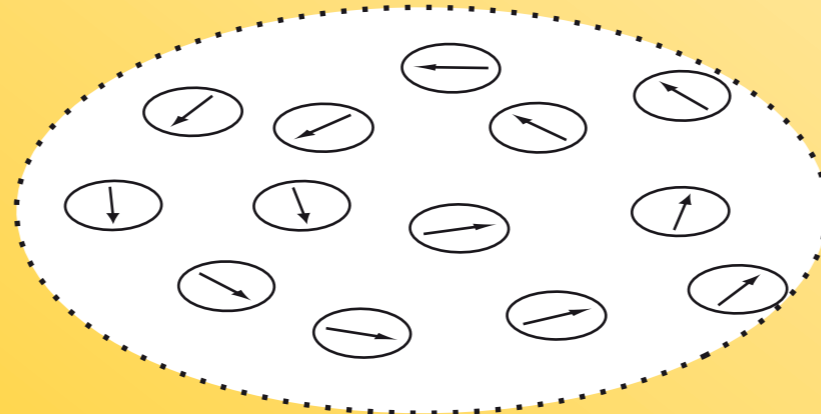
rotation

MT



**pattern
velocity**

V1



**component
direction**

Hierarchy of recurrent networks

MST

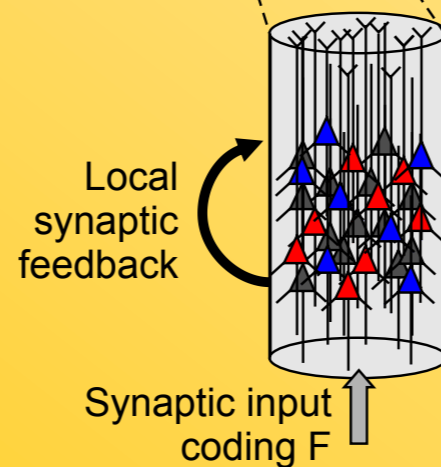
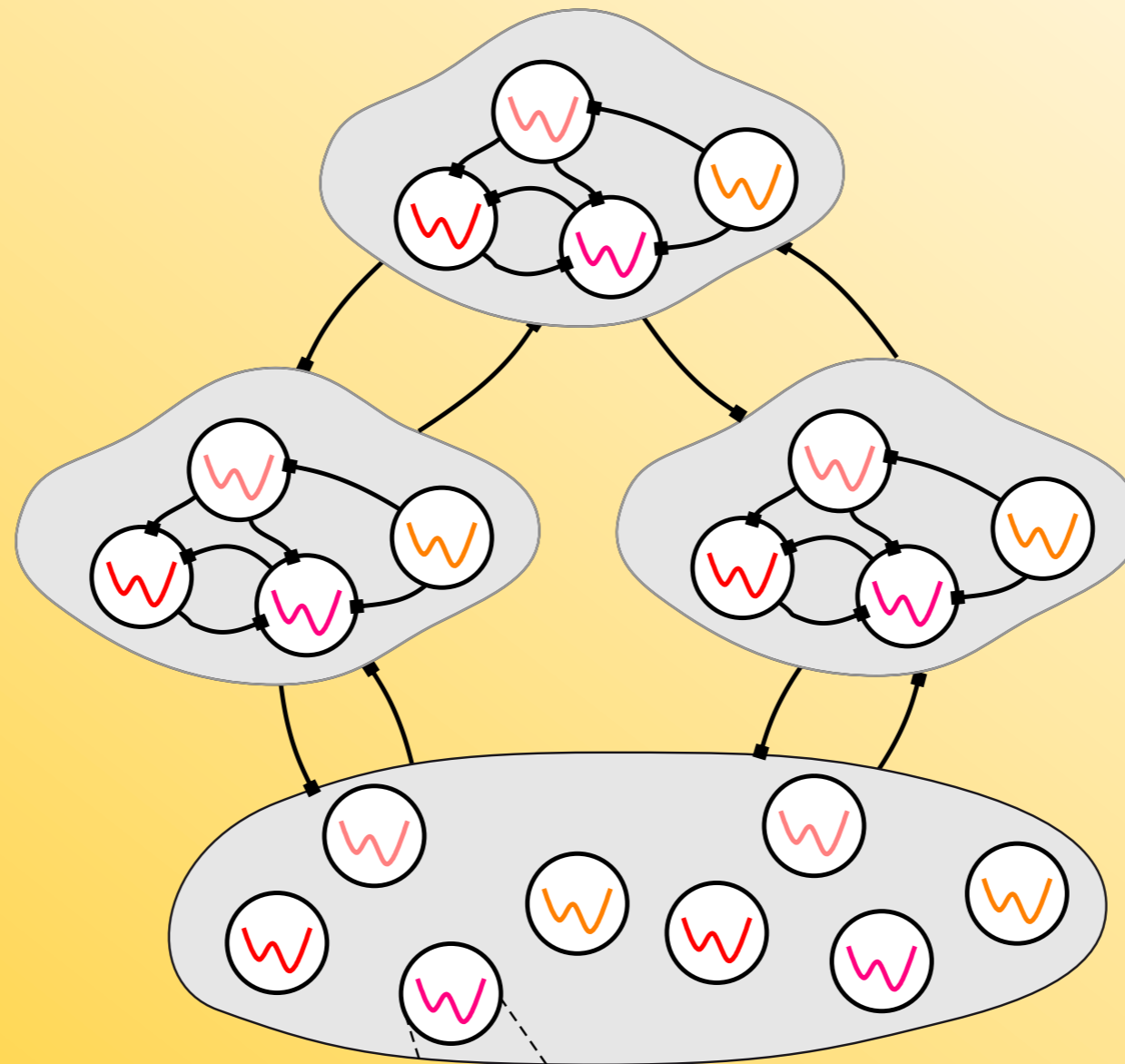
rotation

MT

**pattern
velocity**

V1

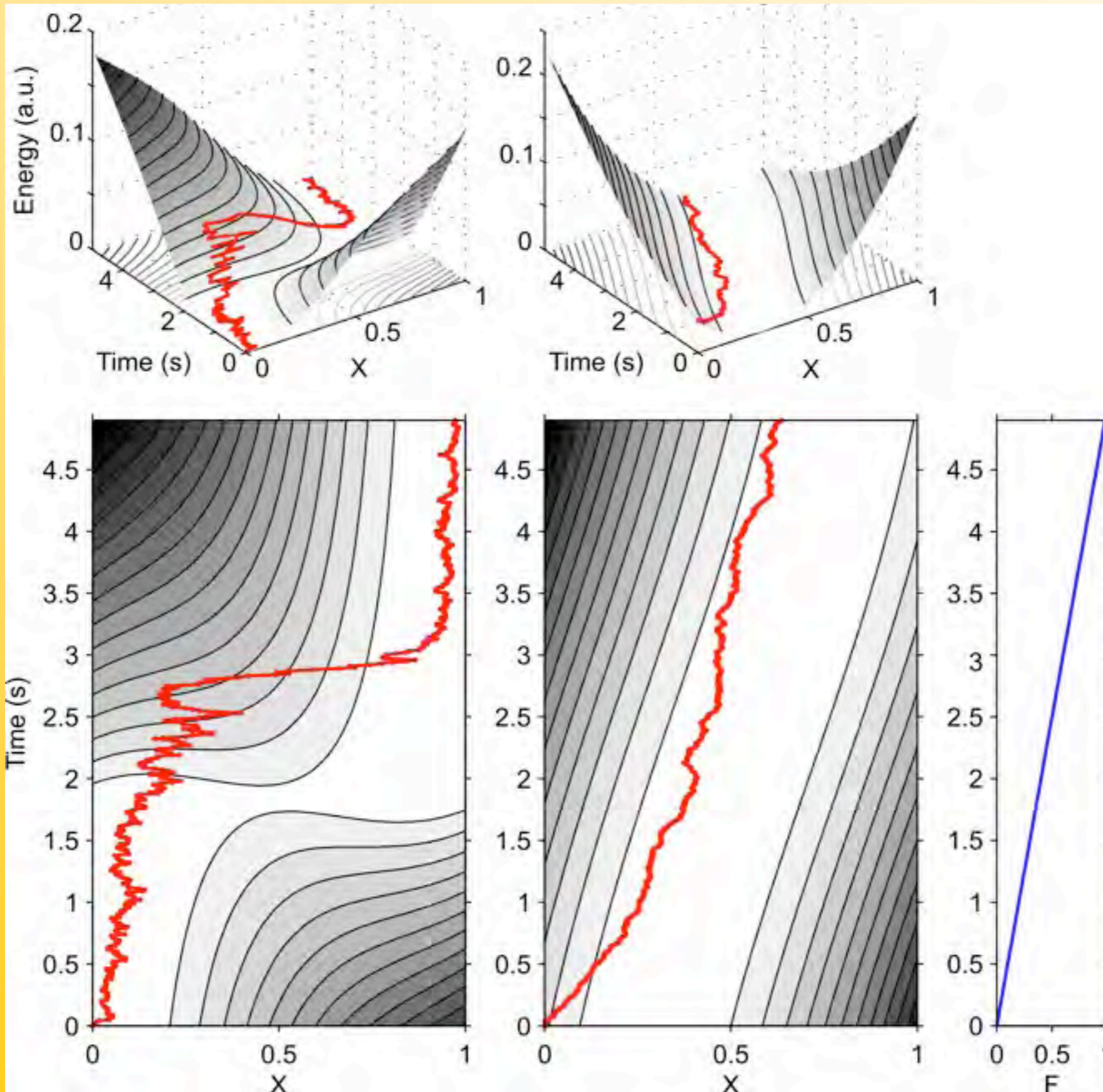
**component
direction**



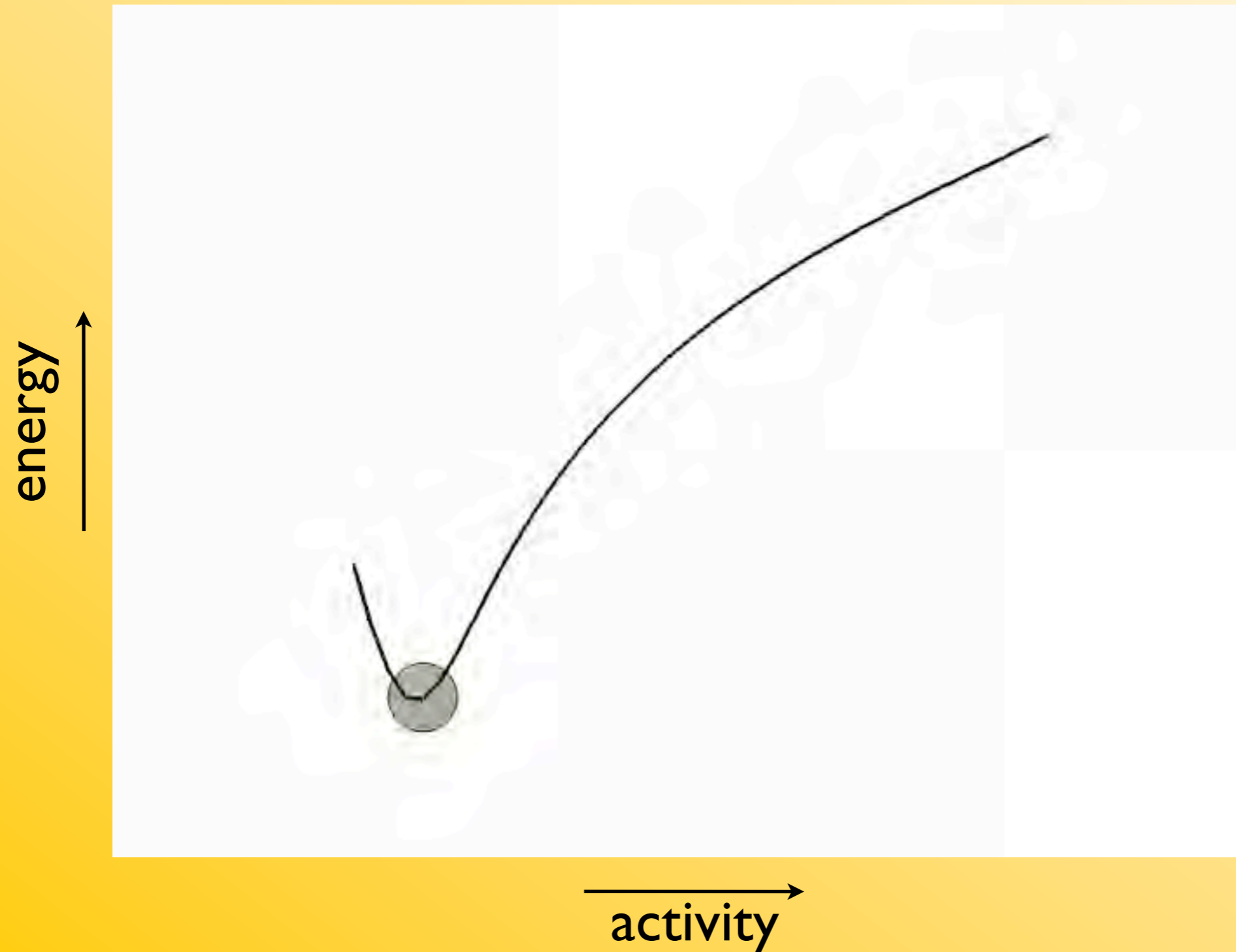
Possible sources of hysteresis

Attractor dynamics

Inertial dynamics



Inertial dynamics



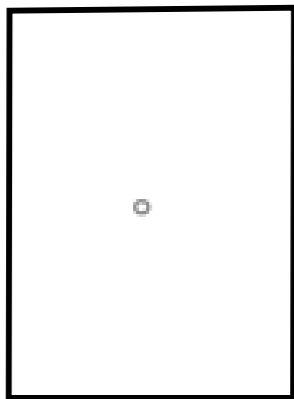
Attractor dynamics



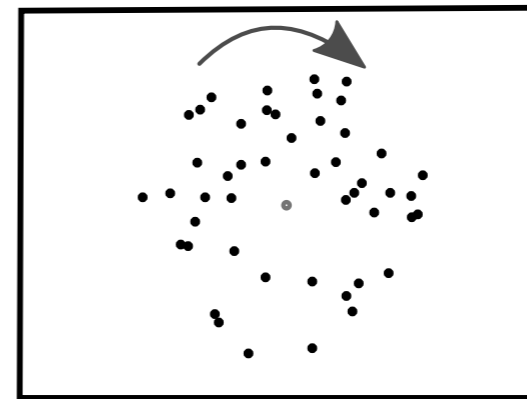
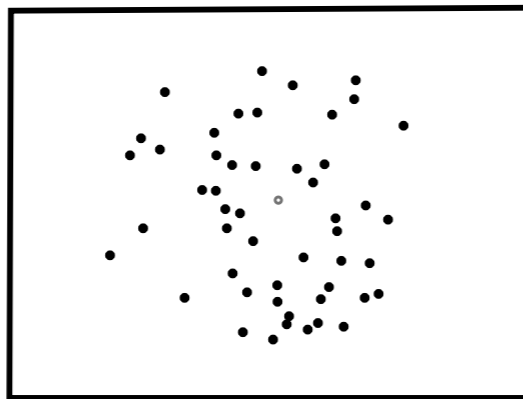
Coherence F follows random walk

RDK

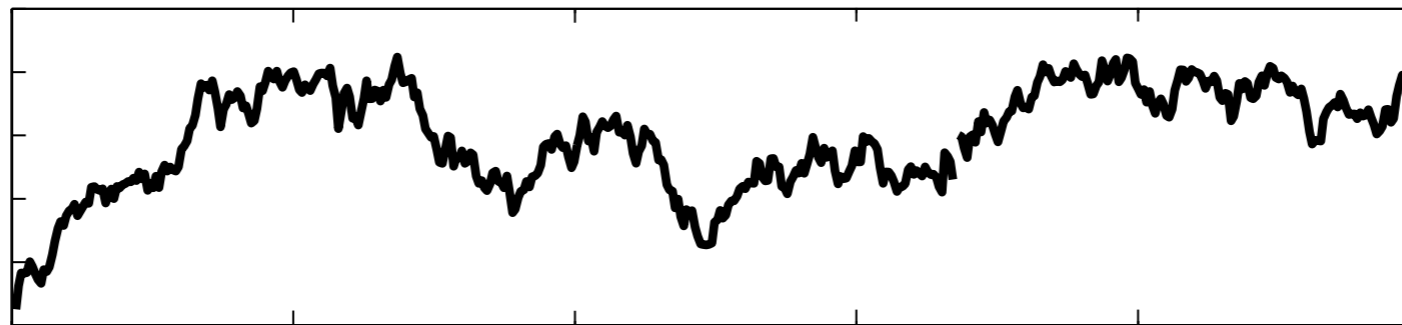
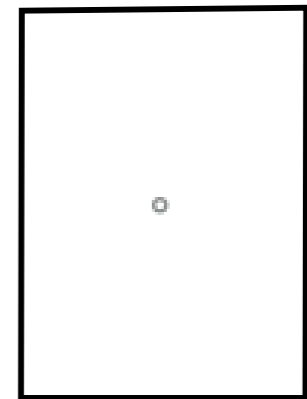
Fixation



with coherence following random walk



Fixation



0.5 - 1 s

5 s

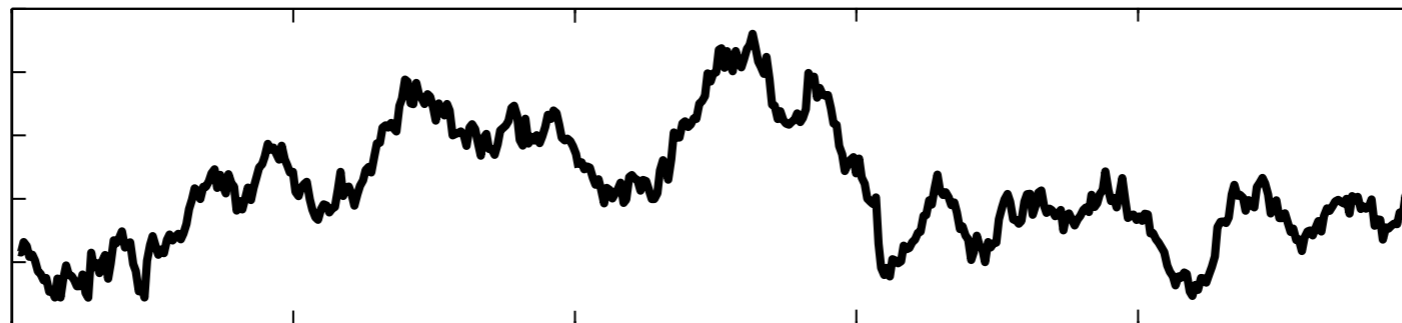
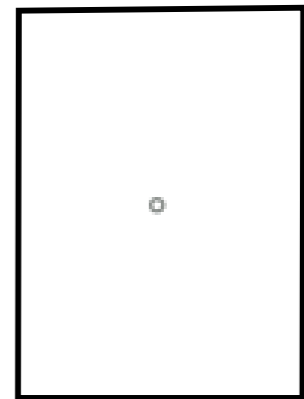
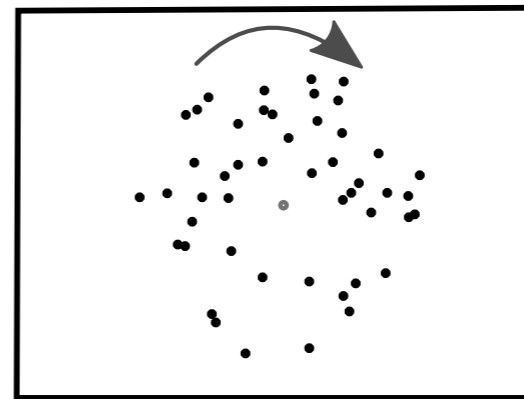
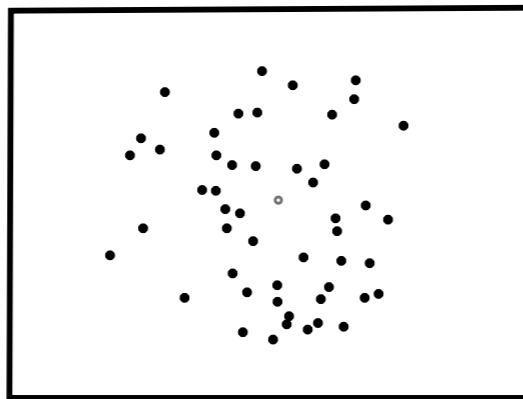
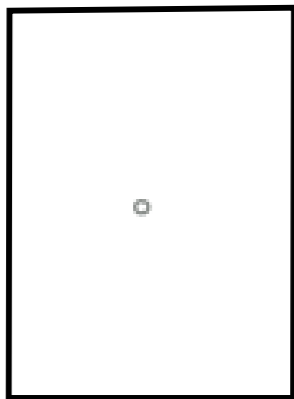
Report

RDK

Fixation

with coherence following random walk

Fixation



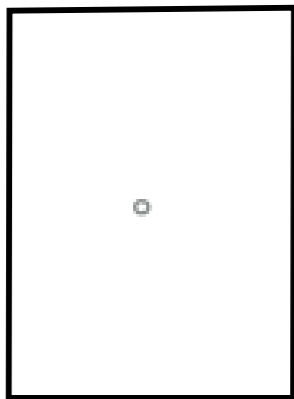
0.5 - 1 s

5 s

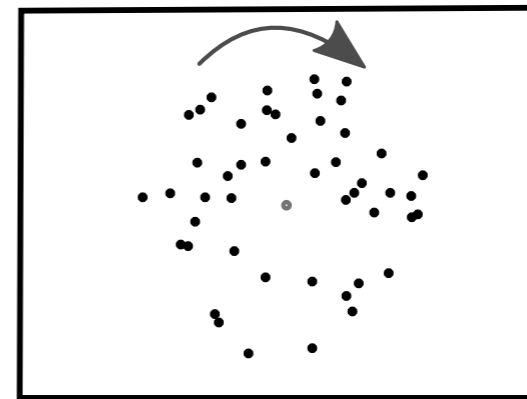
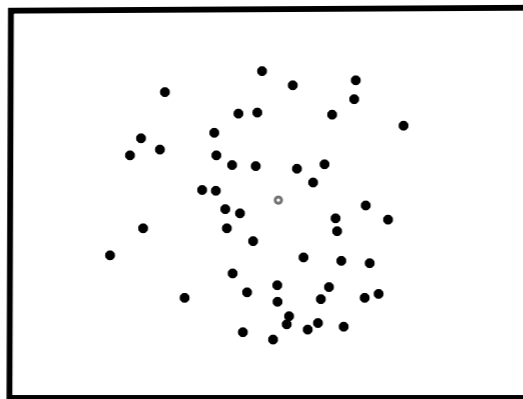
Report

RDK

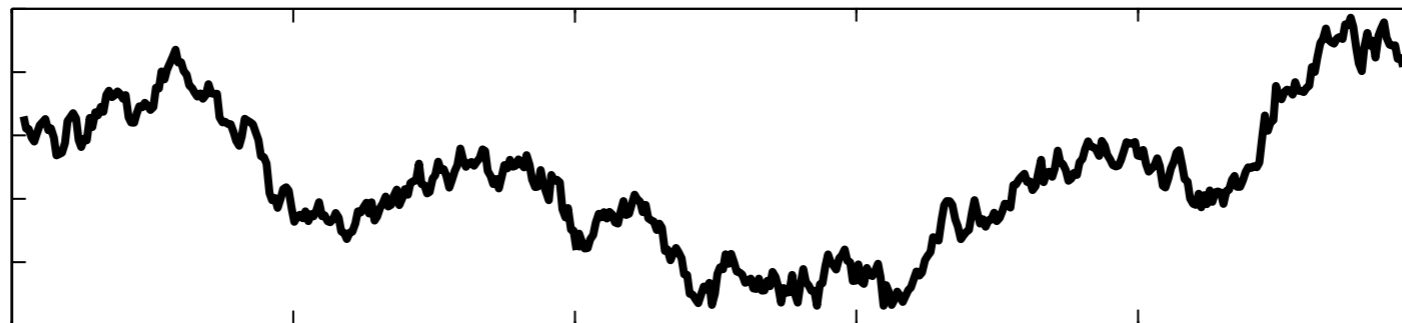
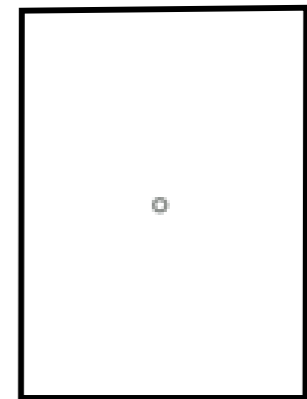
Fixation



with coherence following random walk



Fixation



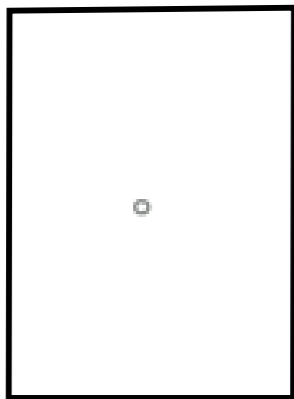
0.5 - 1 s

5 s

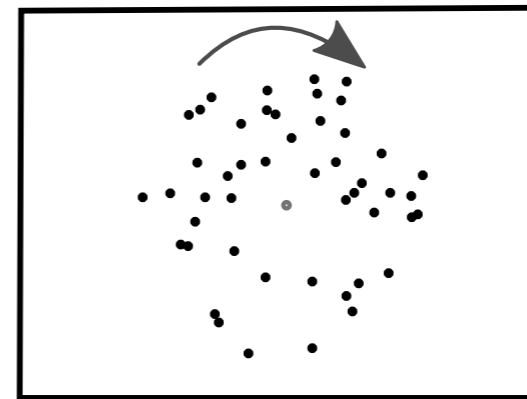
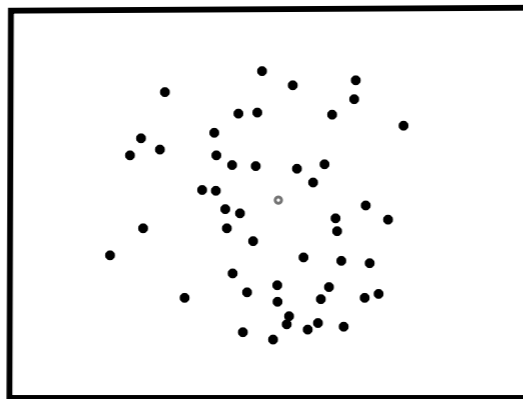
Report

RDK

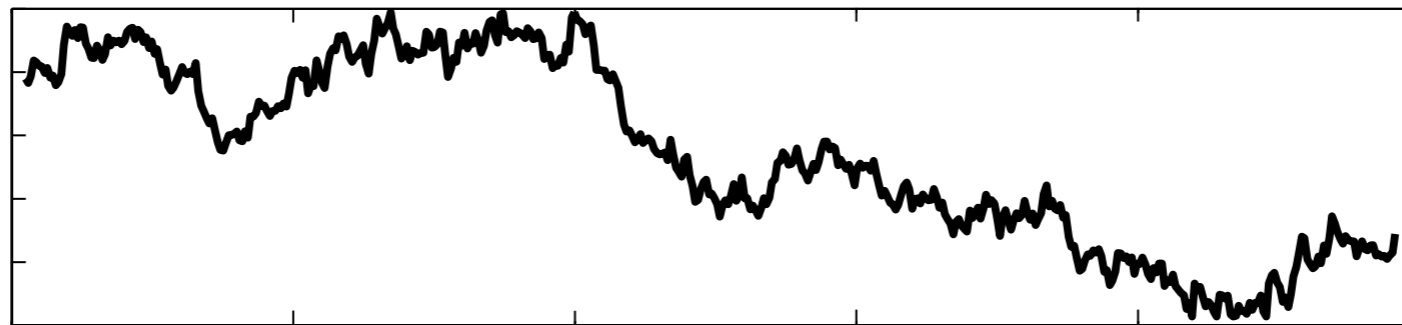
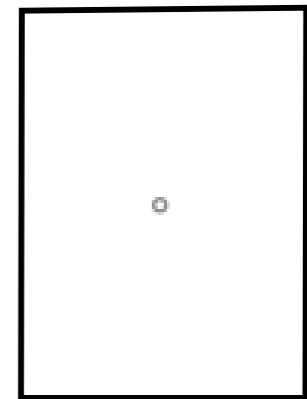
Fixation



with coherence following random walk



Fixation

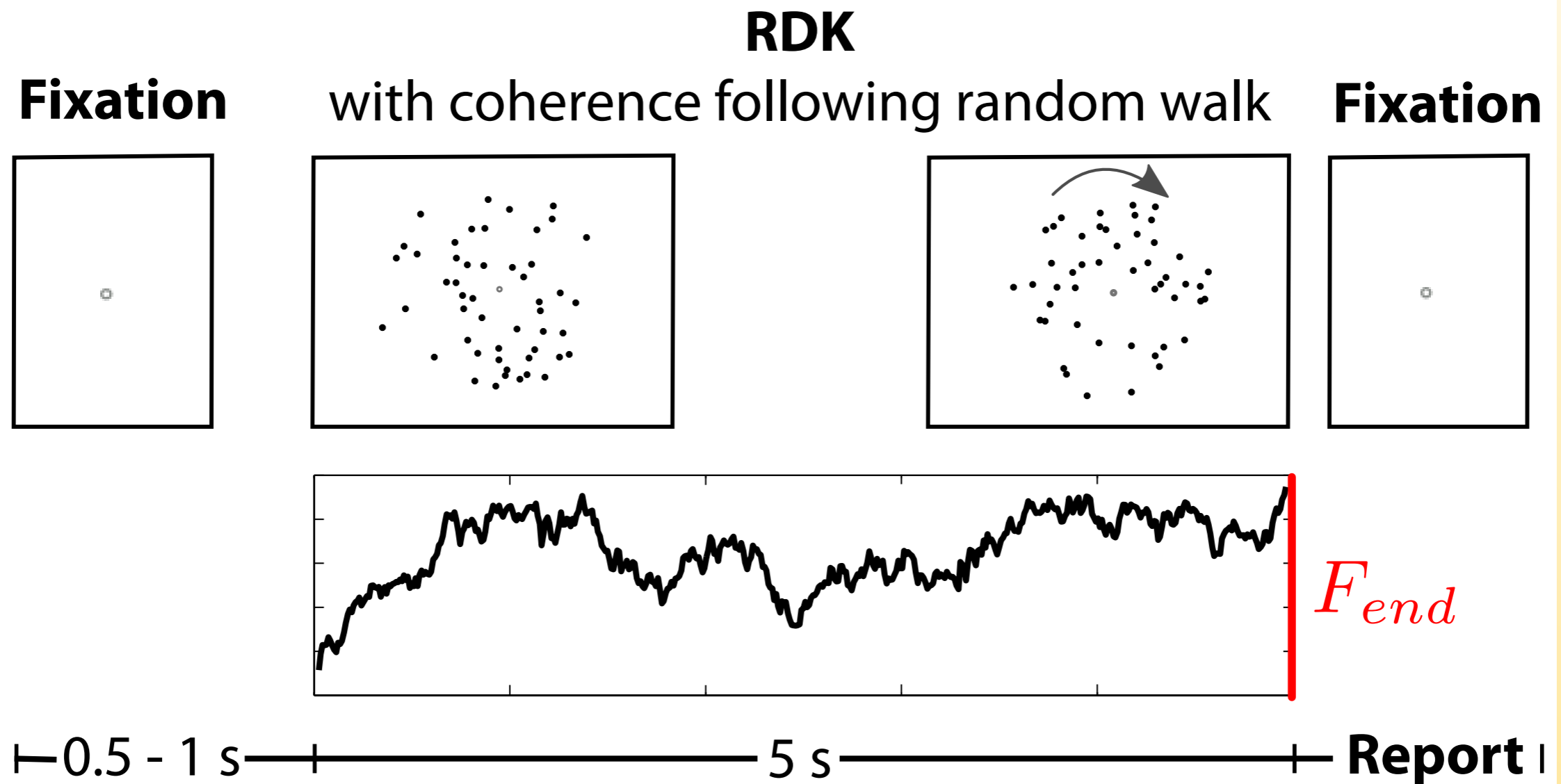


0.5 - 1 s

5 s

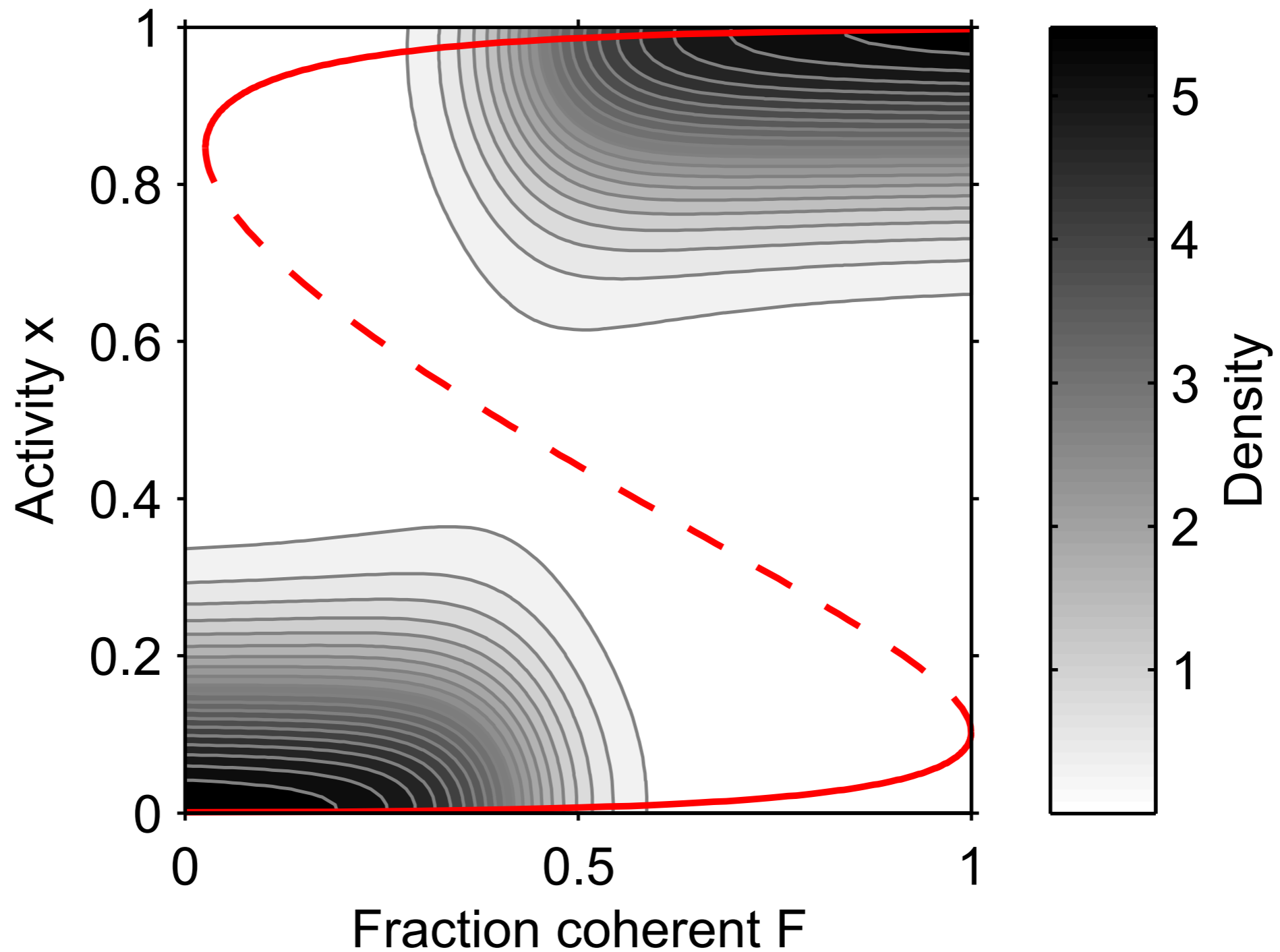
Report

Observer reports final appearance



Fast attractor dynamics

$\tau = 10 \text{ ms}$



Fast attractor dynamics

$\tau = 26$ ms

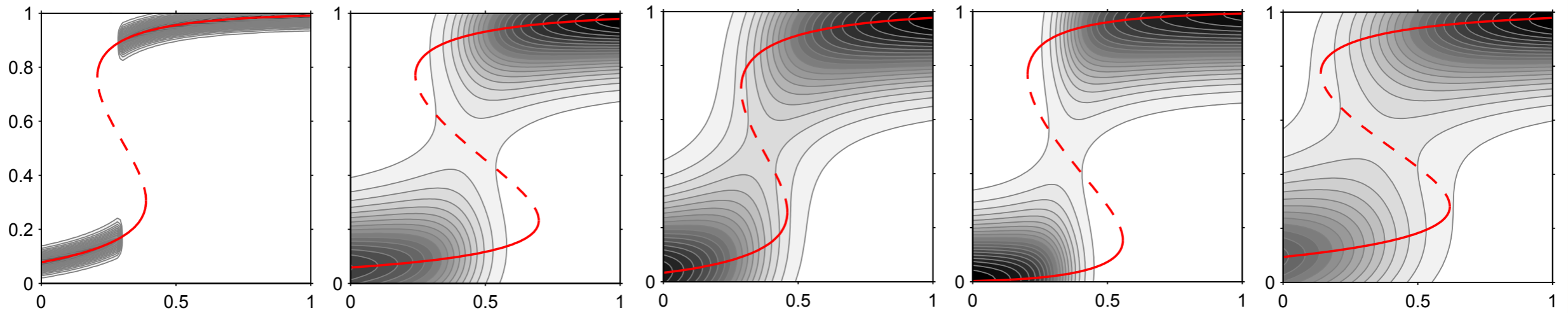
25 ms

32 ms

19 ms

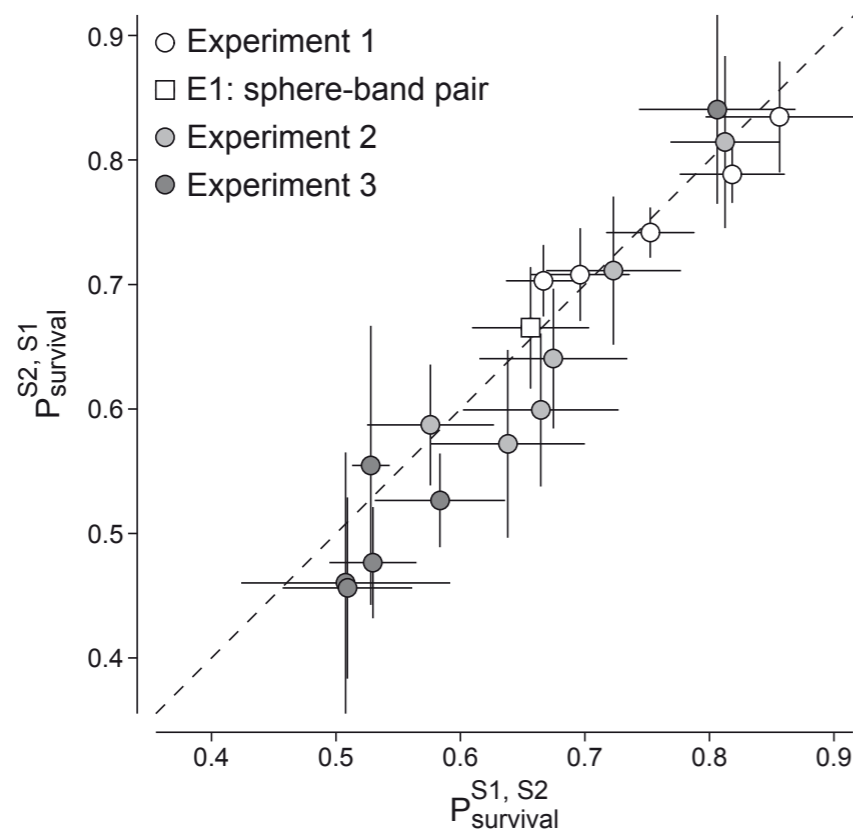
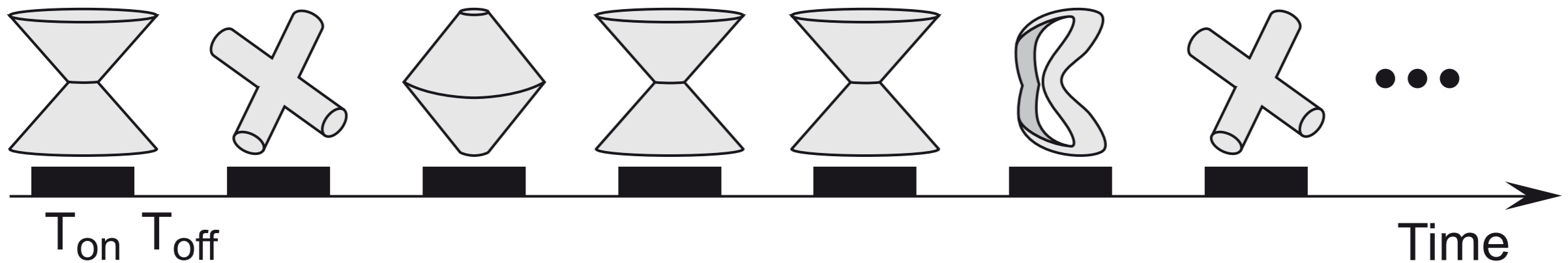
30 ms

activity x



coherence F

Shape-specificity of sensory memory priming



Pastukhov, Braun, 2013

Pastukhov, Füllekrug, Braun, 2013

Pastukhov, Lissner, Füllekrug, Braun 2013

Pastukhov, Lissner, Braun, 2013

Three-level model (qualitative)

PFC

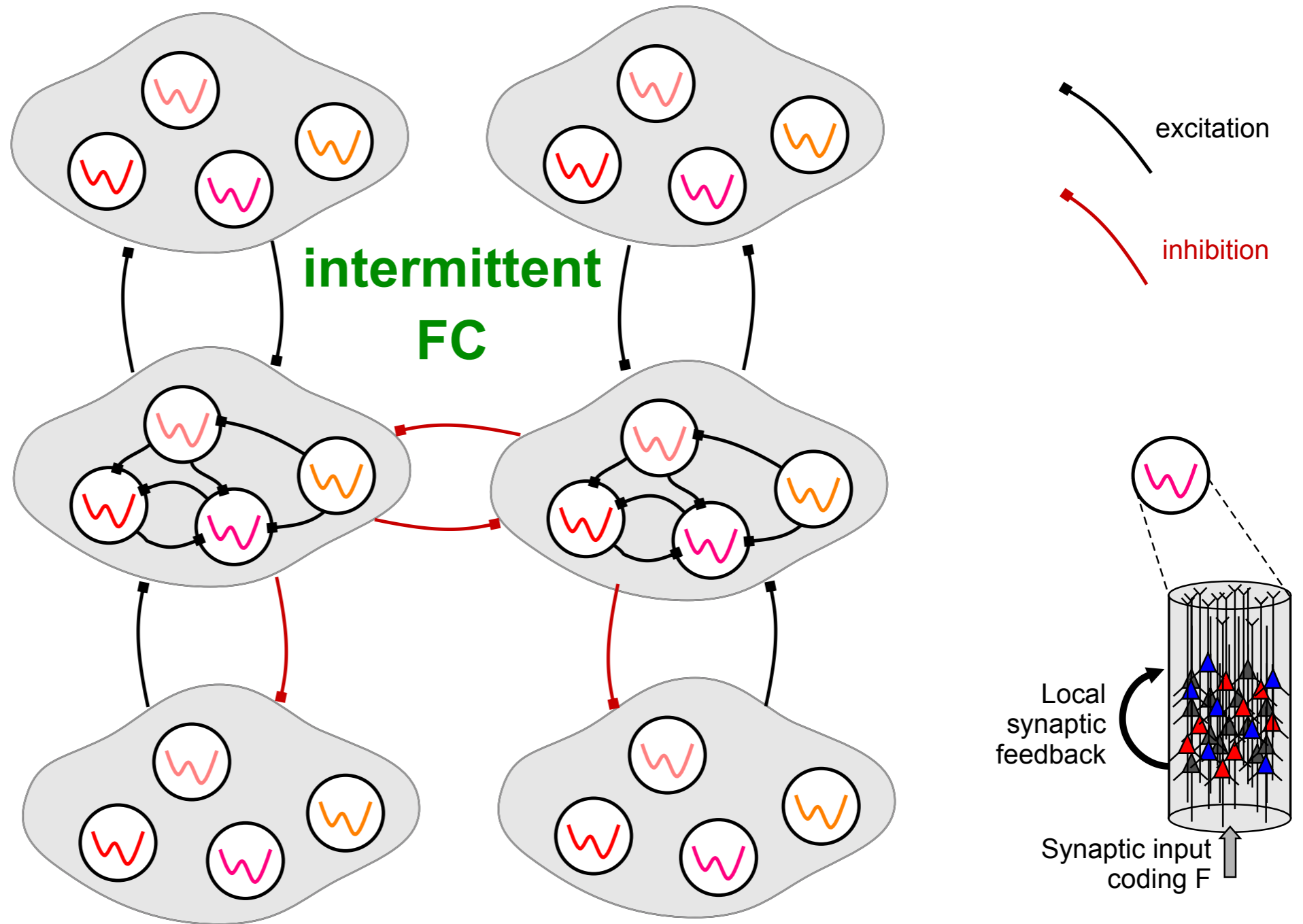
'sensory
memory'

IPS

'limited
capacity'

VC

'evidence
accumulation'



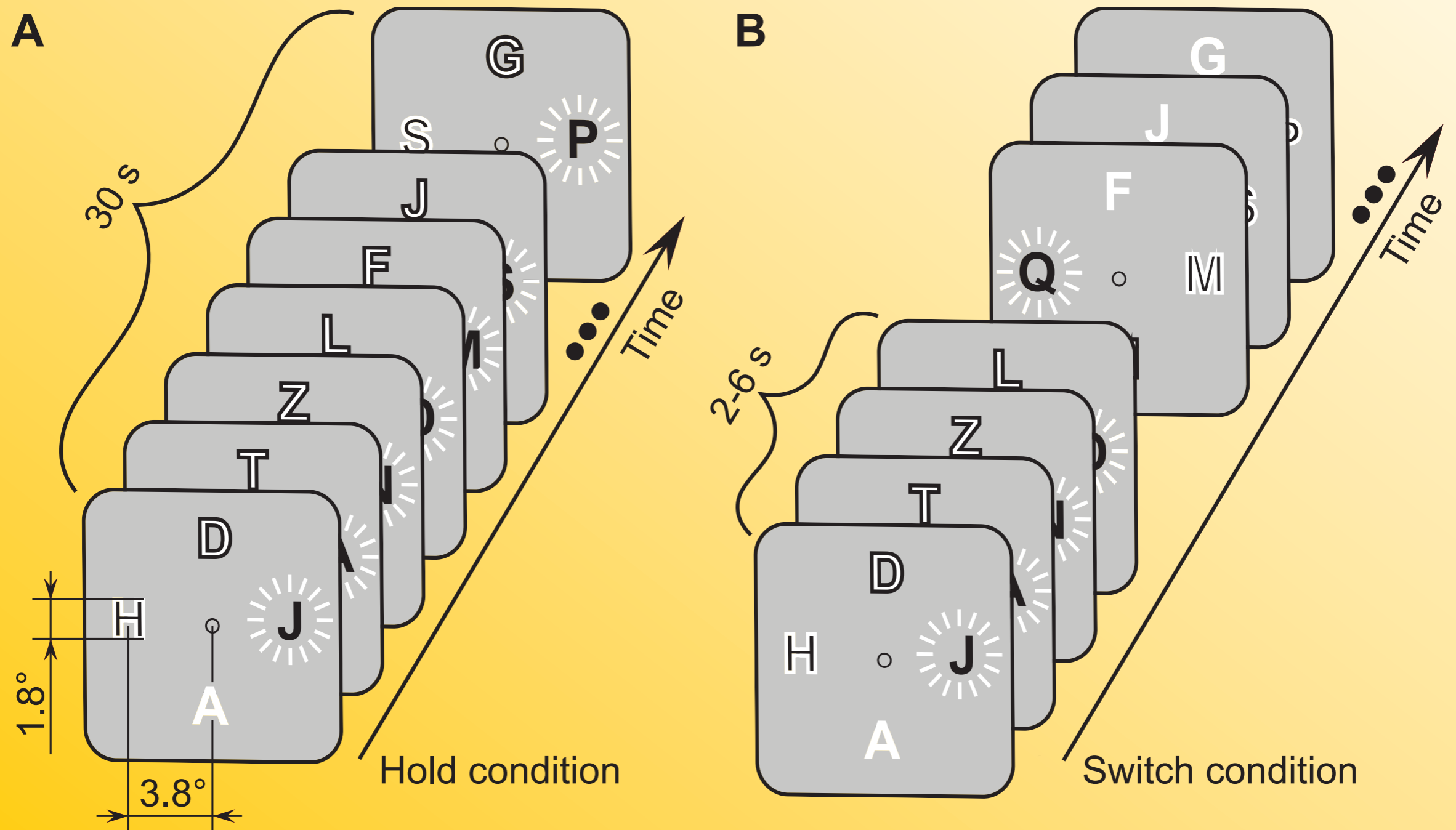
3. Spontaneous ongoing attention dynamics

Perceptual dynamics fixes large-scale interactions & flags intermittent attentional engagement

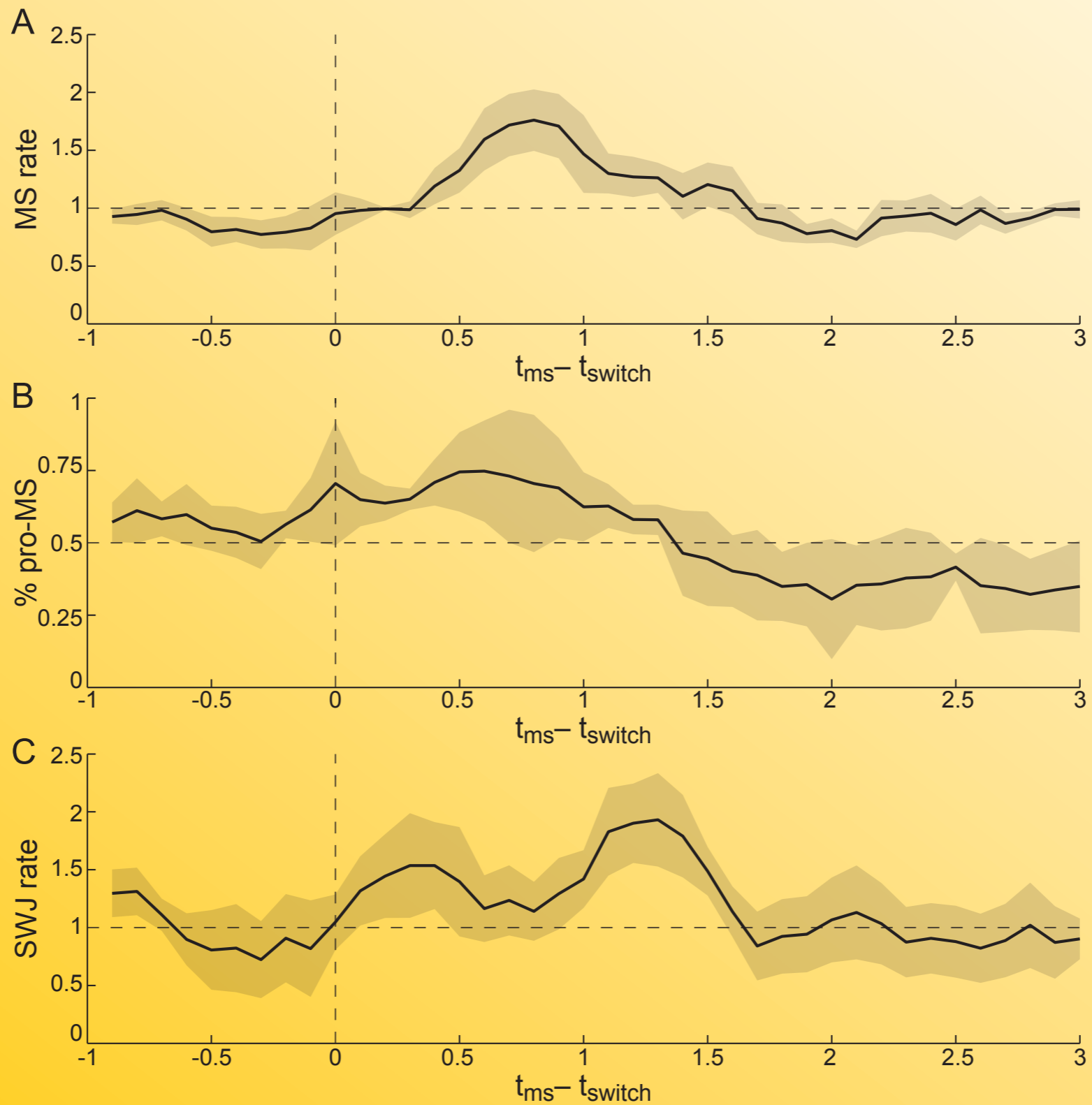
Functional connectivity (resting & task)

Structural connectivity (DSI)

Attentional engagement confirmed by microsaccades



Attentional engagement confirmed by microsaccades



Attentional engagement confirmed by task interference

