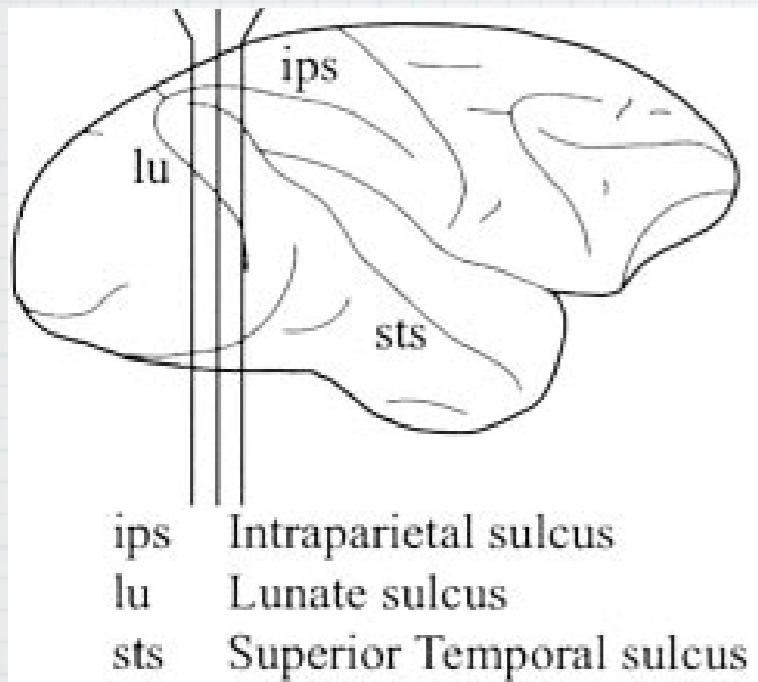


# BioE332 Lecture 2: Decision Making

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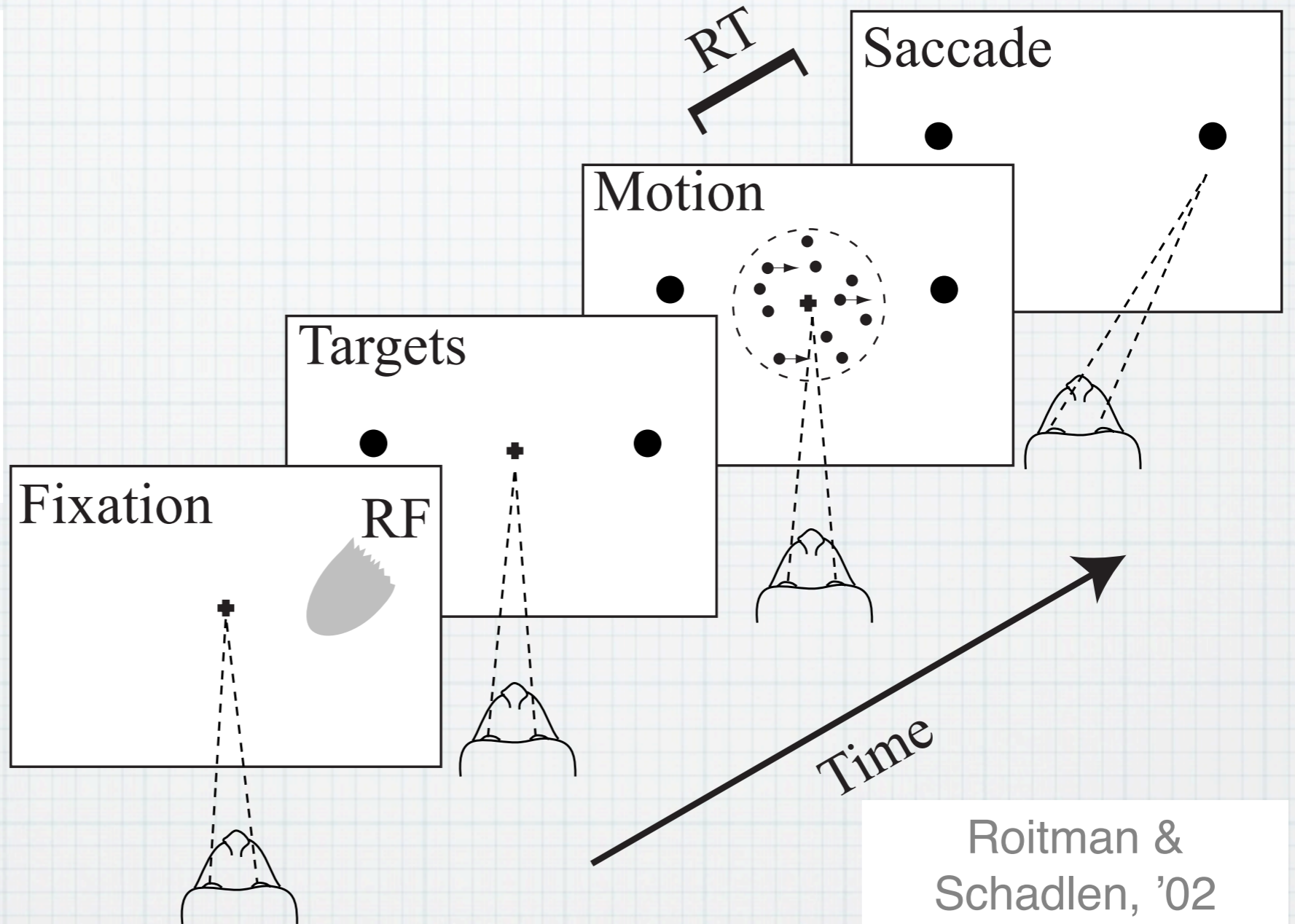
Kwabena Boahen  
Spring 2013

# Direction discrimination task



ips Intraparietal sulcus  
lu Lunate sulcus  
sts Superior Temporal sulcus

Schadlen '99

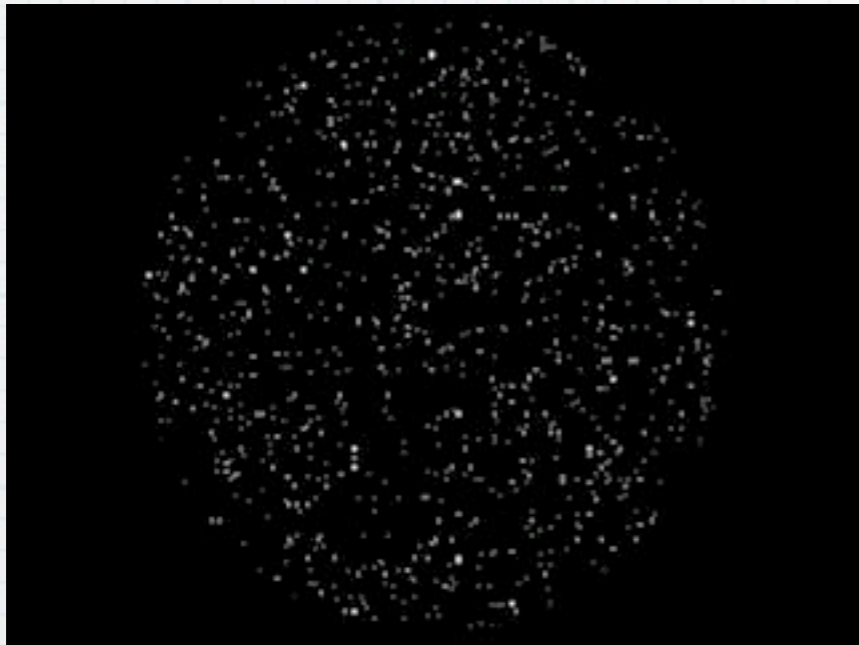


- \* Reaction-time task: Monkey saccades to indicate motion direction as soon as it is certain.
- \* Other version of task had fixed viewing duration.

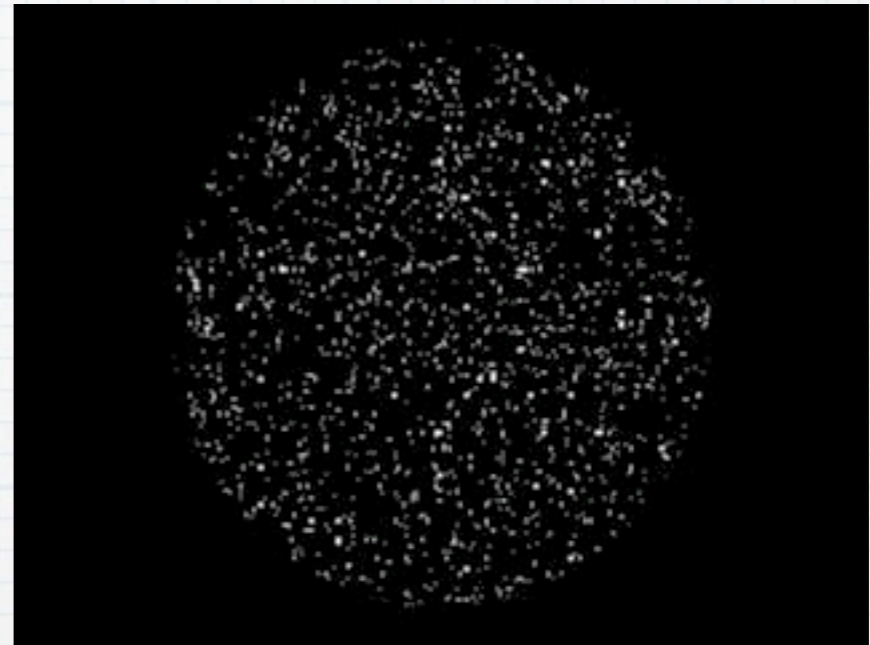


# Random-dot display

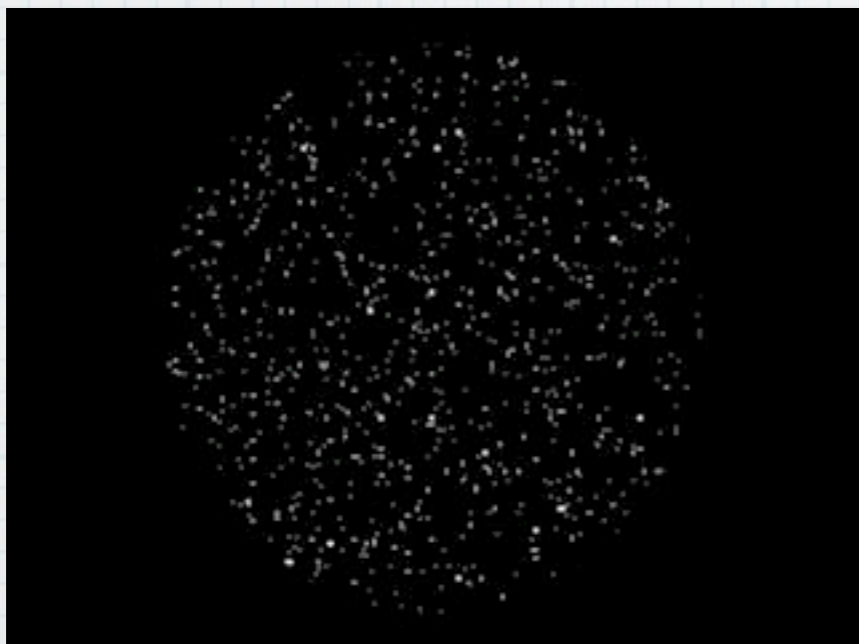
100%



30%



5%

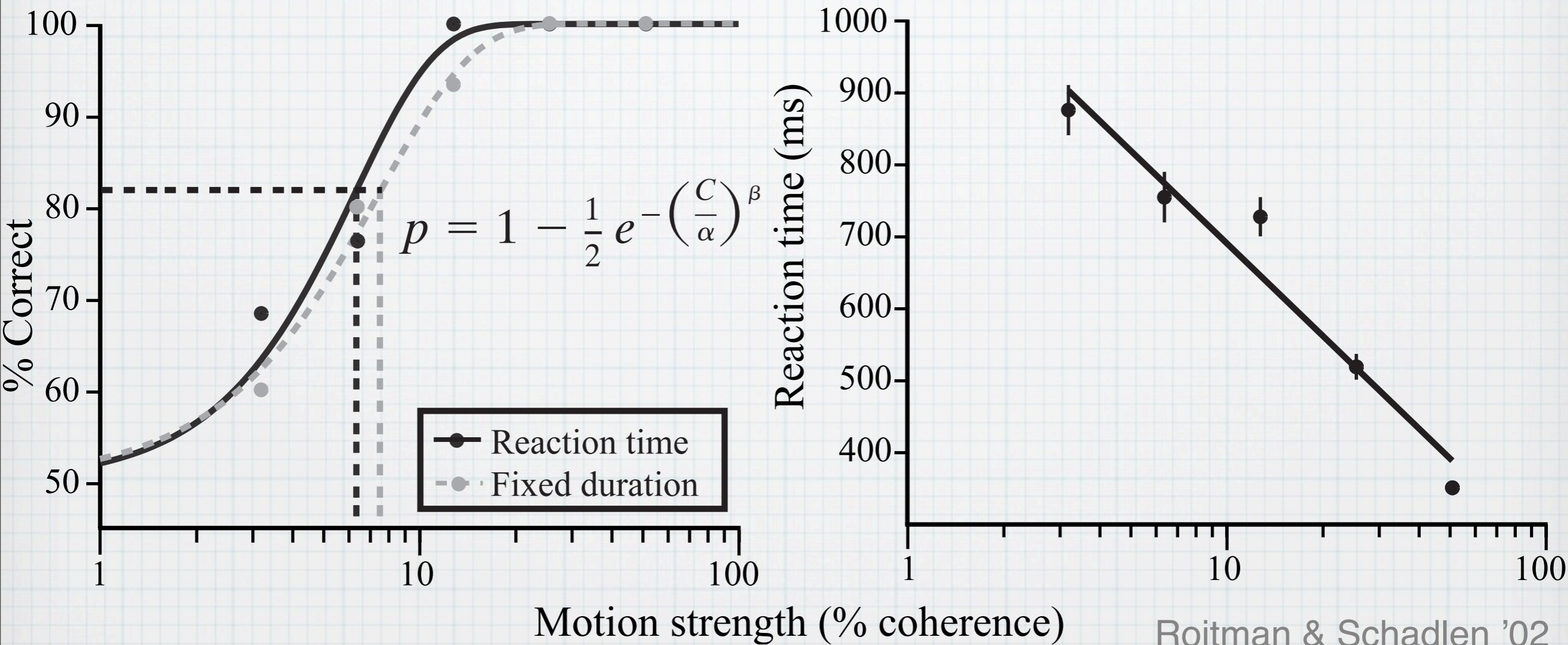


0%





# Psychophysics: Percent correct and reaction time

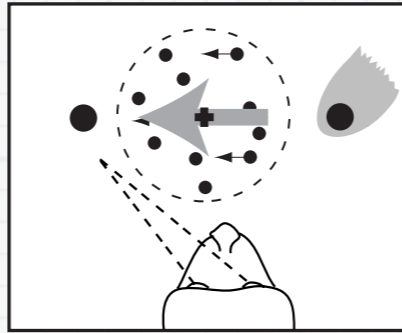
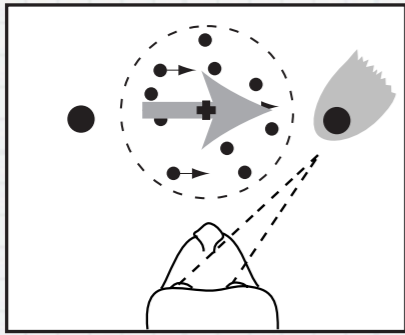


Roitman & Schadlen '02

\* Weibull function fits with  $\alpha=7-11$  and  $\beta=1.4-1.7$

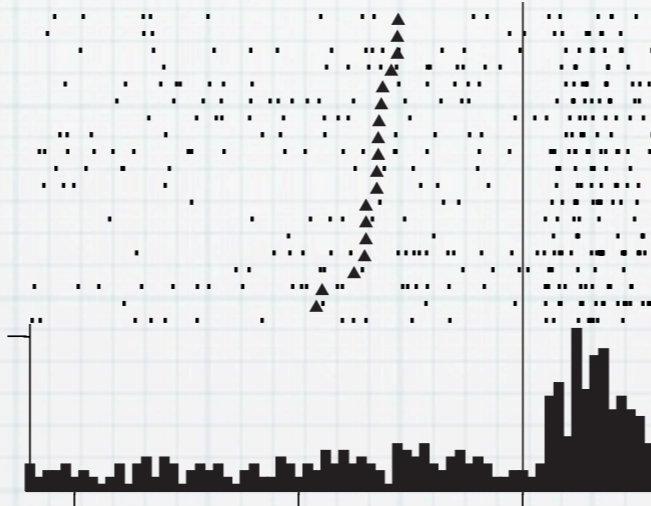
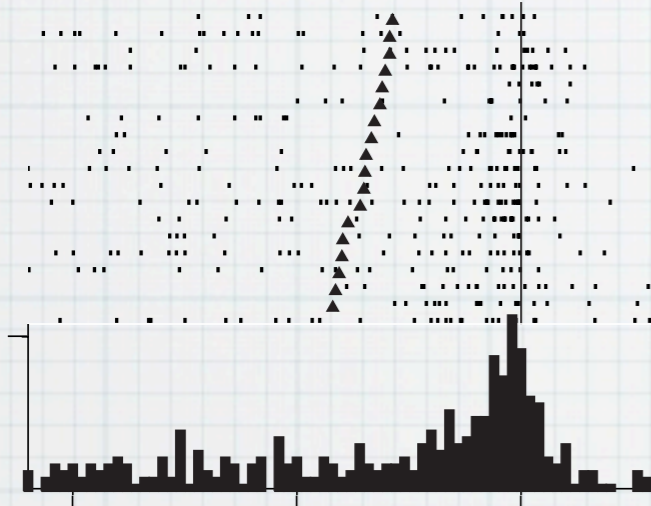


# LIP neuron responses (RT)



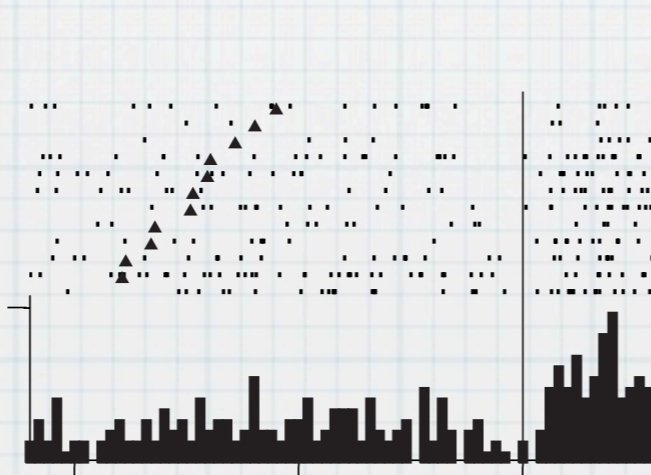
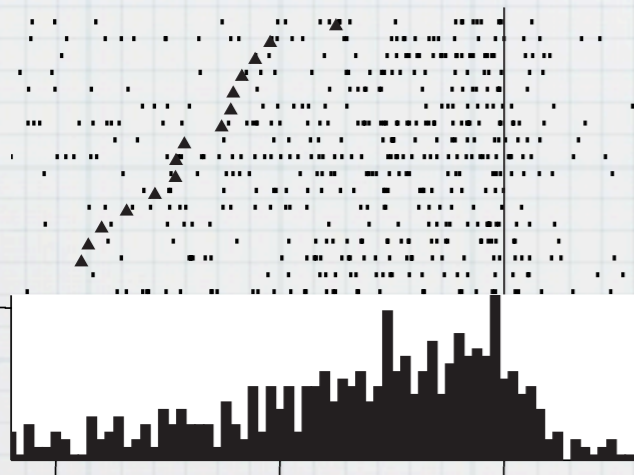
\* Spike trains aligned to saccade; stimulus onset indicated by claret; only correct choices shown

motion sac 51.2%



\* Spike rate builds up when target is in cell's RF

6.4%



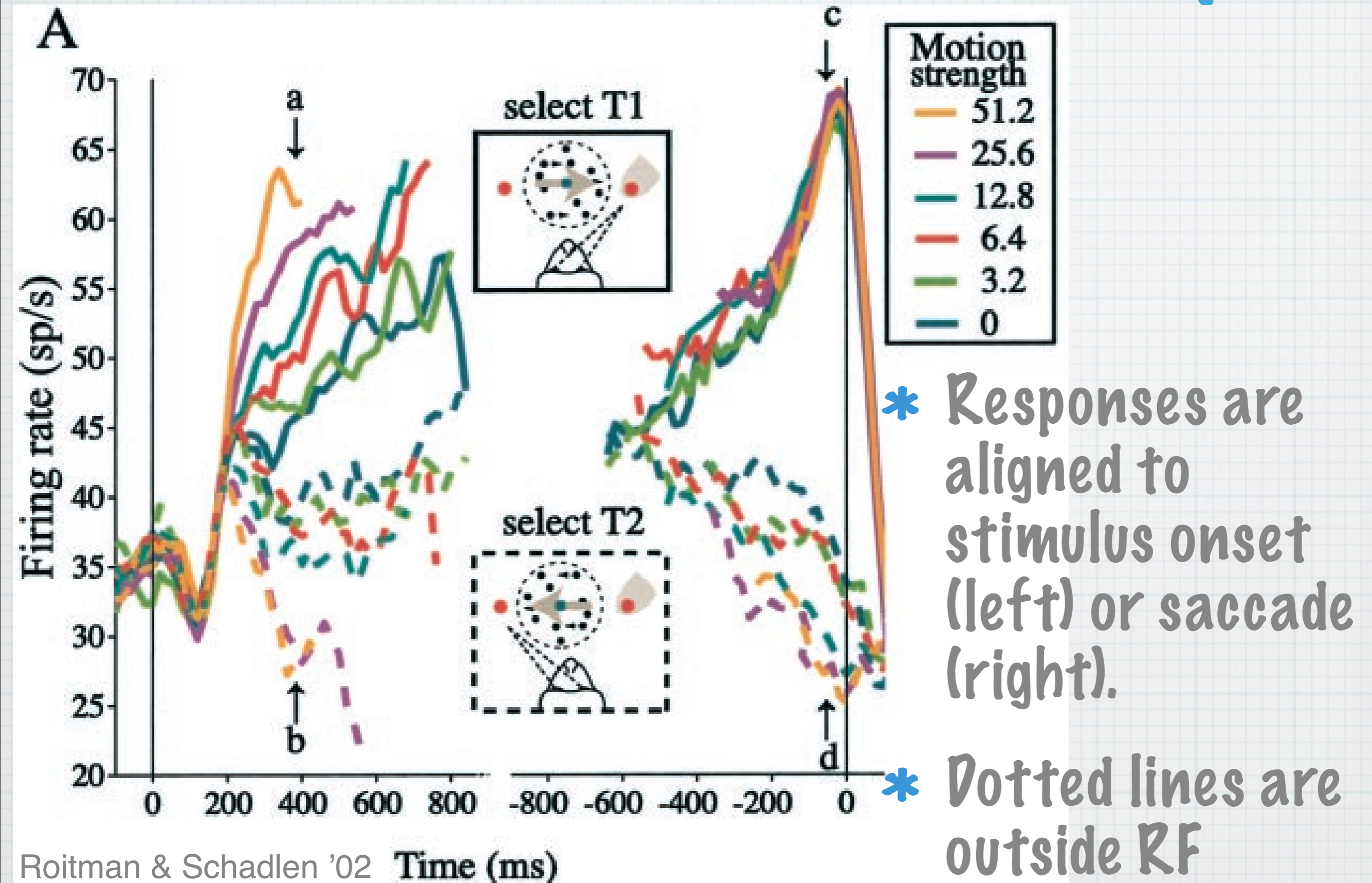
\* RT is longer when coherence is low

Spikes/s 60

500 ms

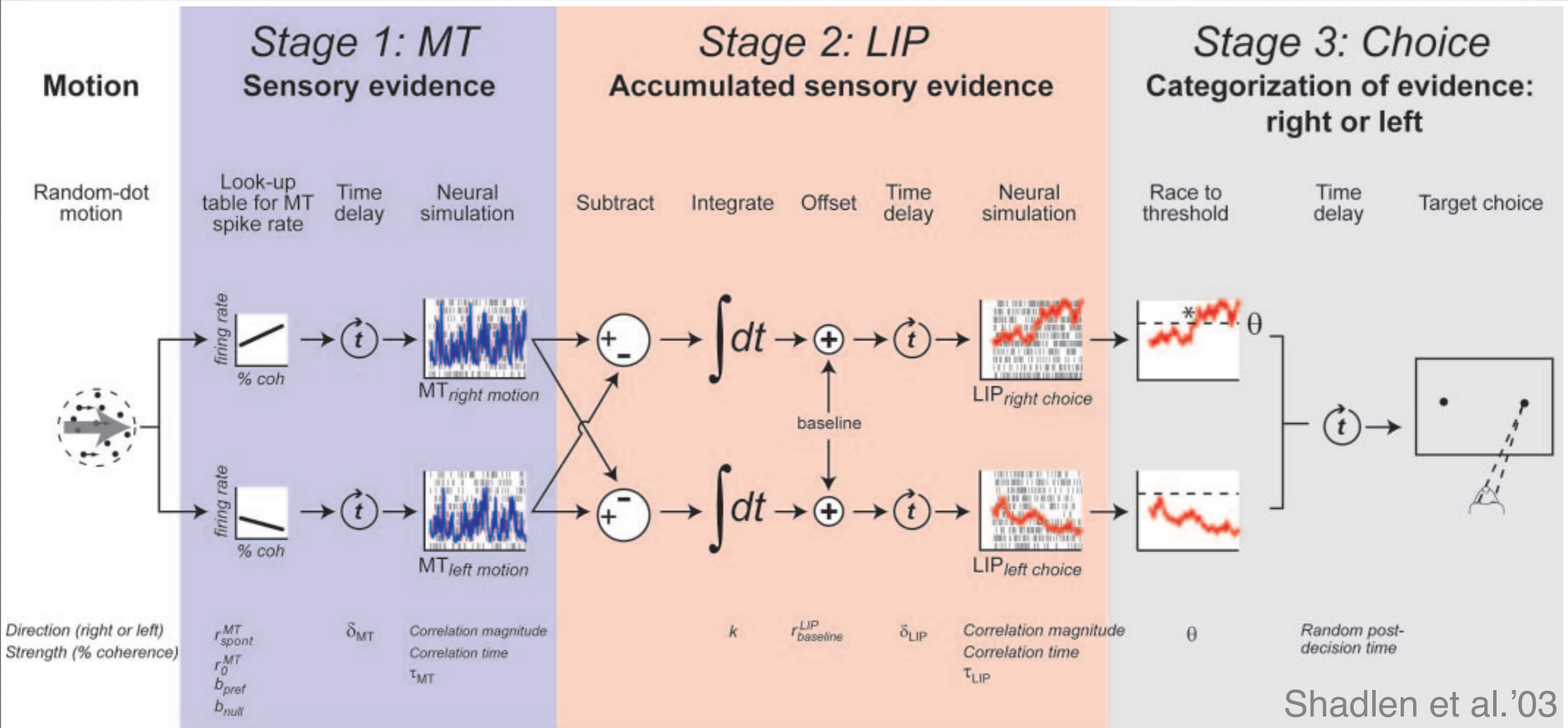
Roitman & Schadlen '02

# Time course of activity





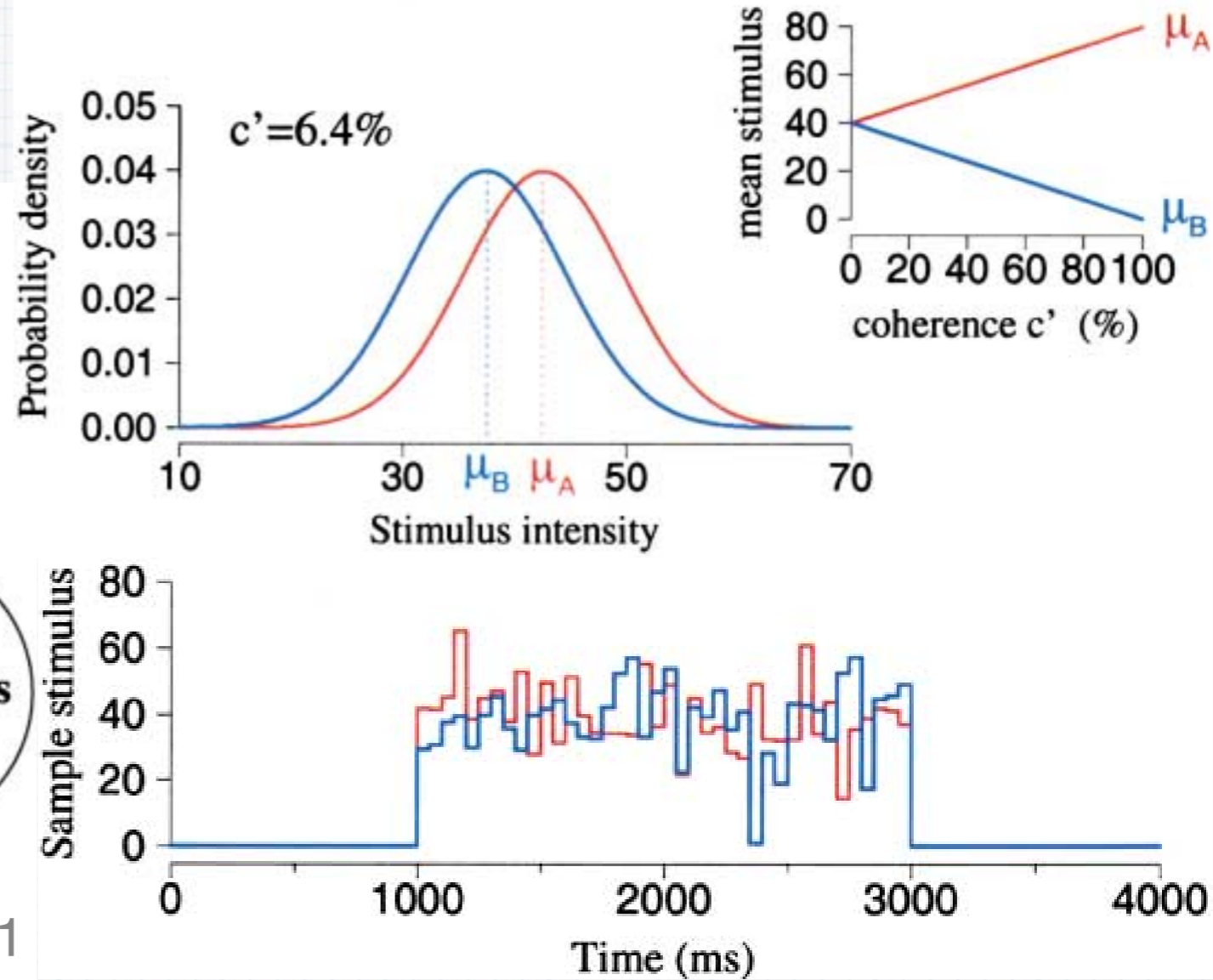
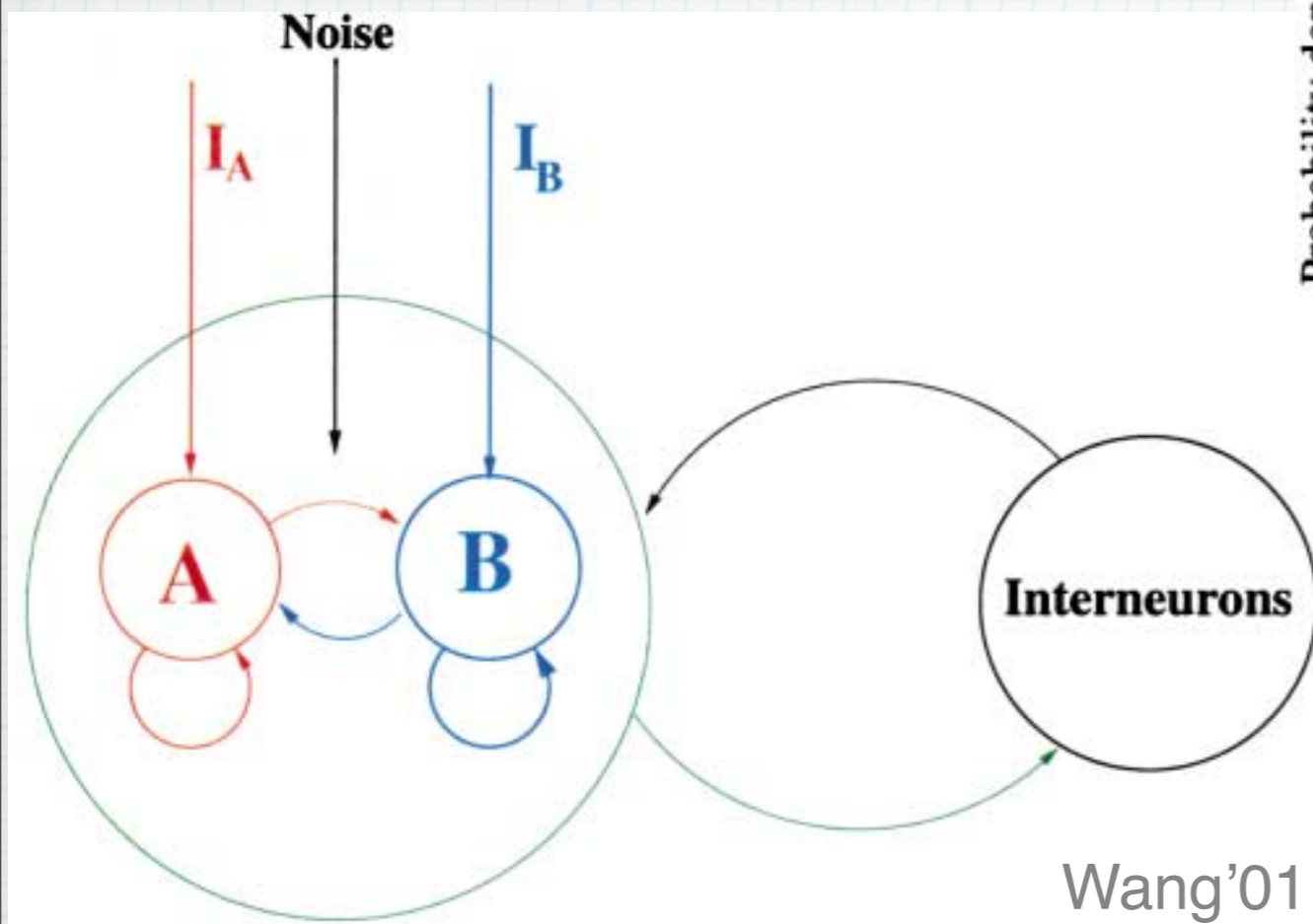
# Abstract model



Shadlen et al.'03

\* Doesn't specify how neurons achieve the key computations: difference, integration, and threshold.

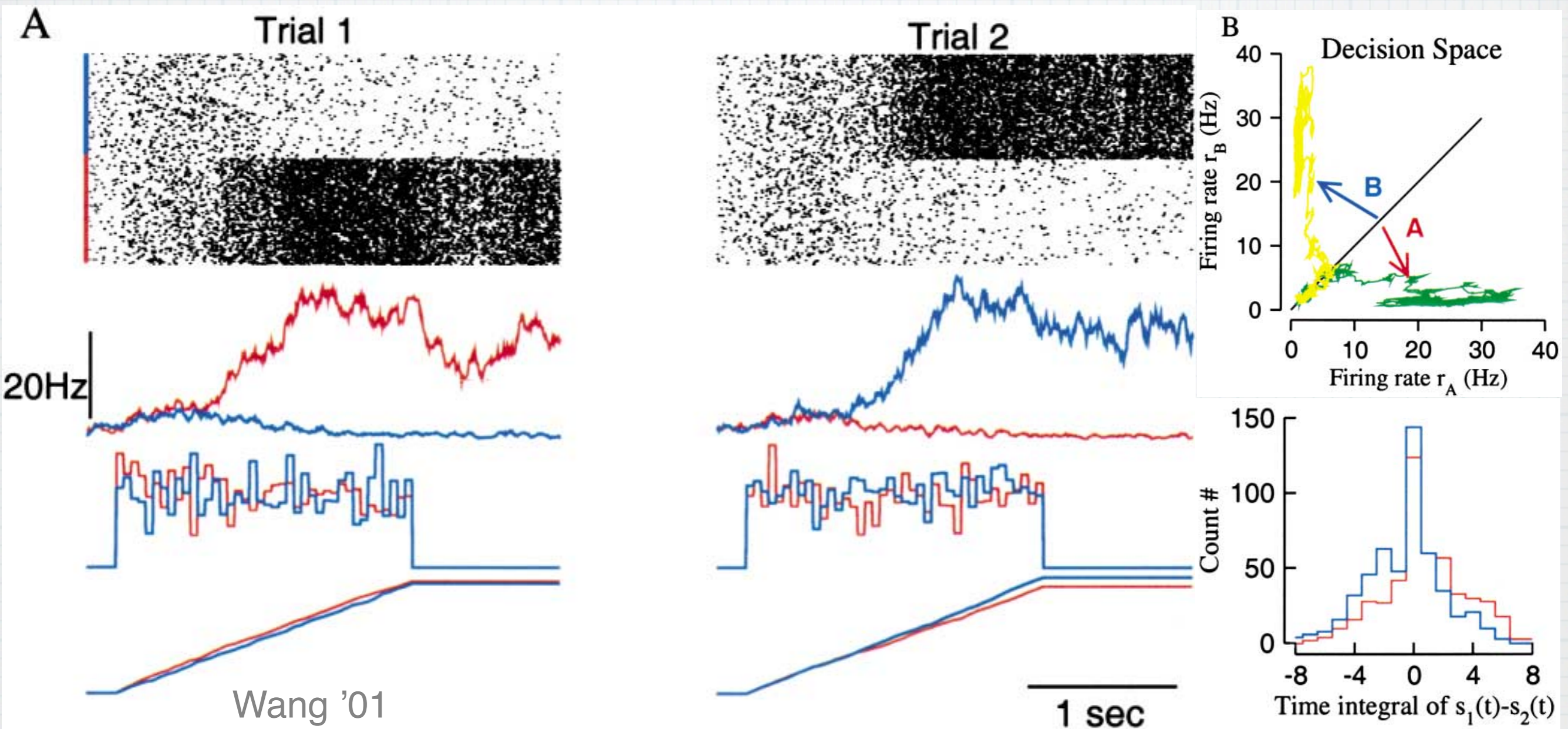
# Circuit model



- \* There are two pyramidal cell populations (groups A and B) with strong recurrent excitatory connections that compete through feedback inhibition from interneurons



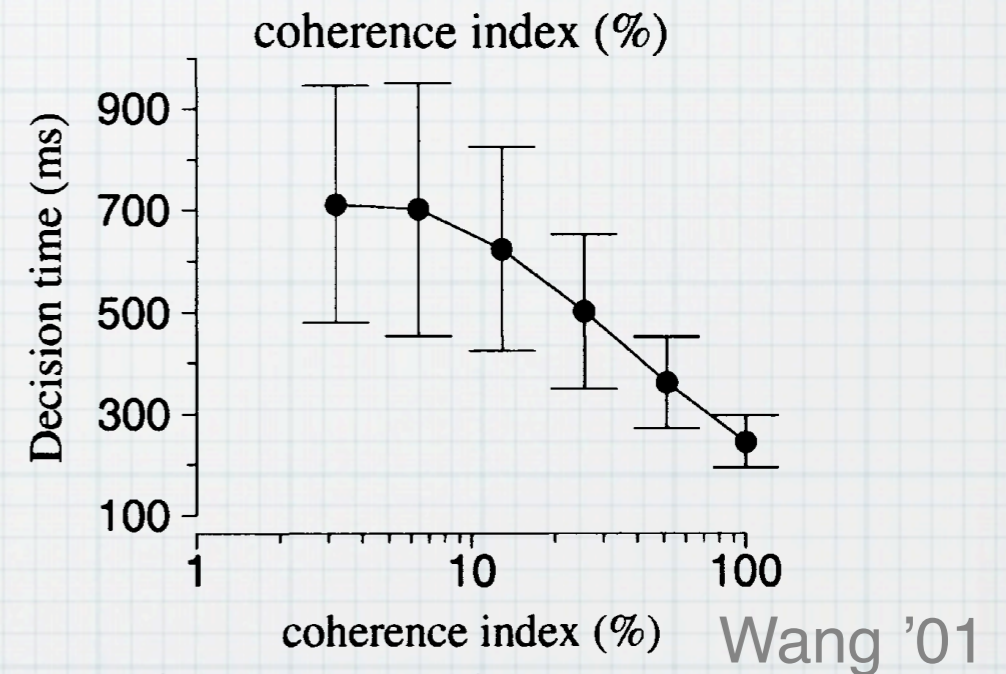
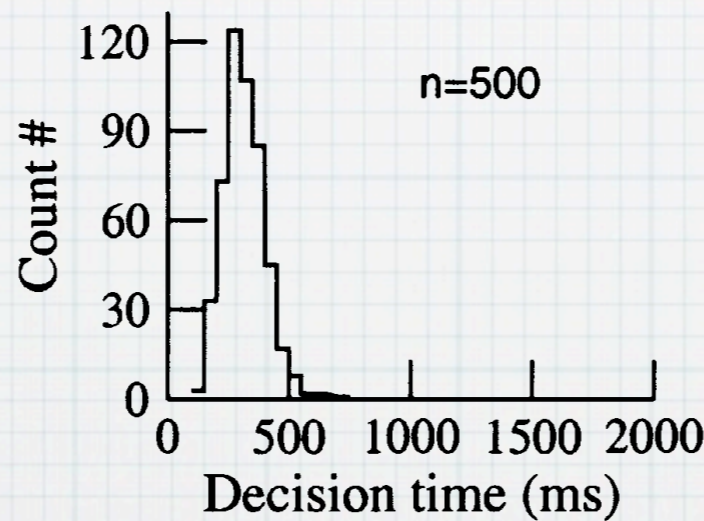
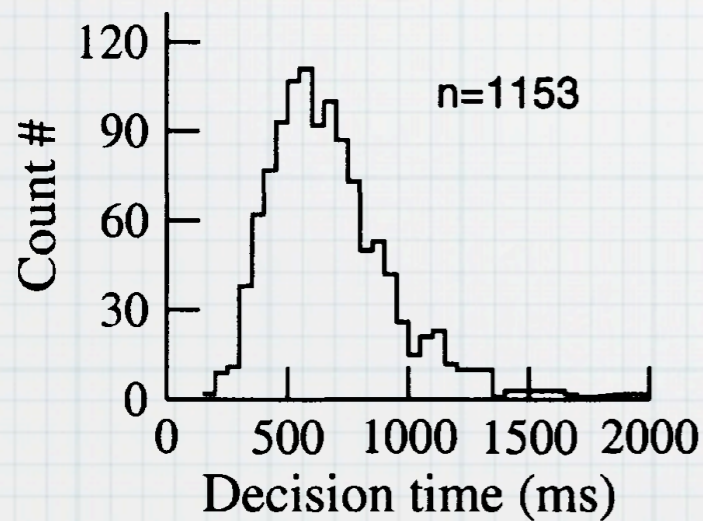
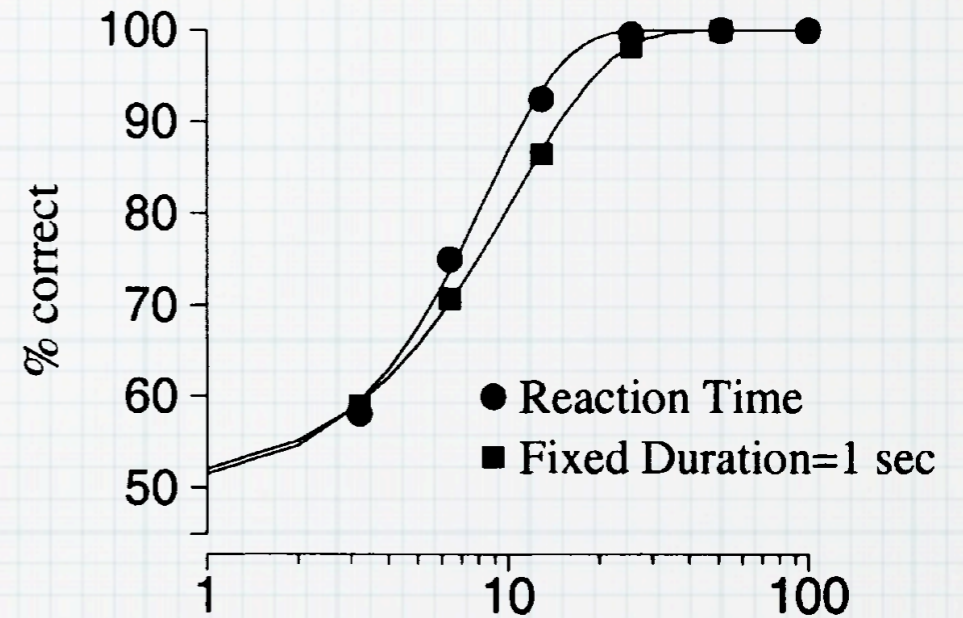
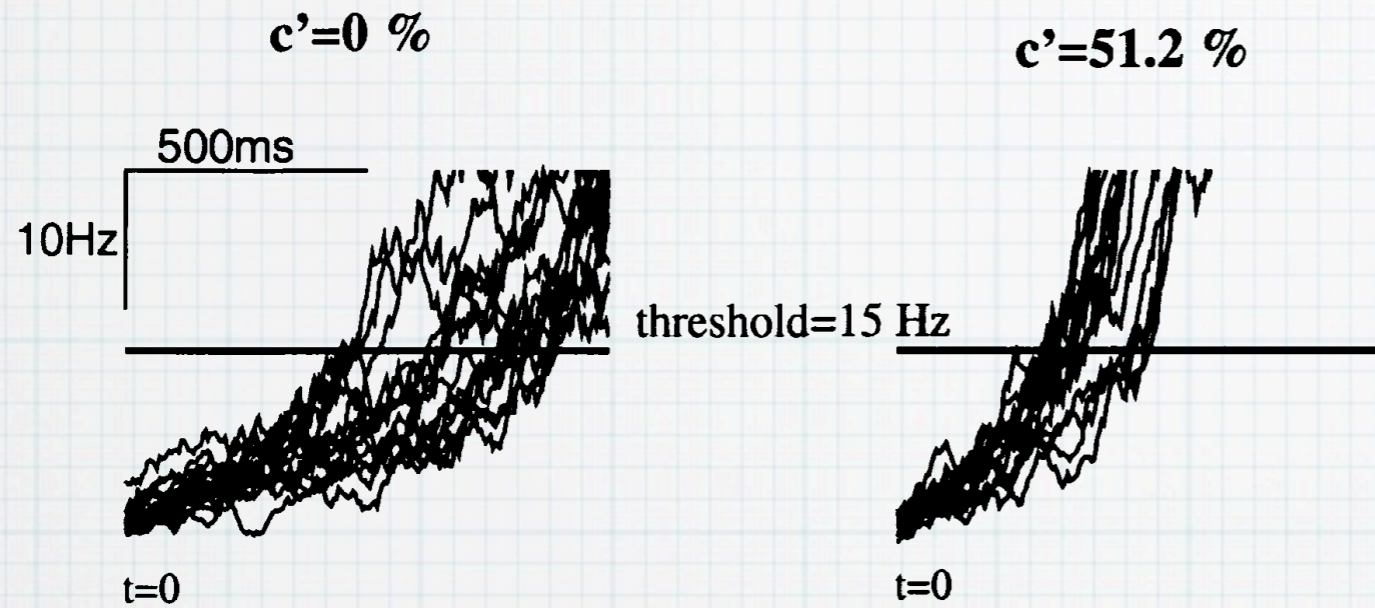
# Coin-tossing with neurons



\* At zero-coherence, either group could win, depending on random fluctuations in input strength as well as added noise.



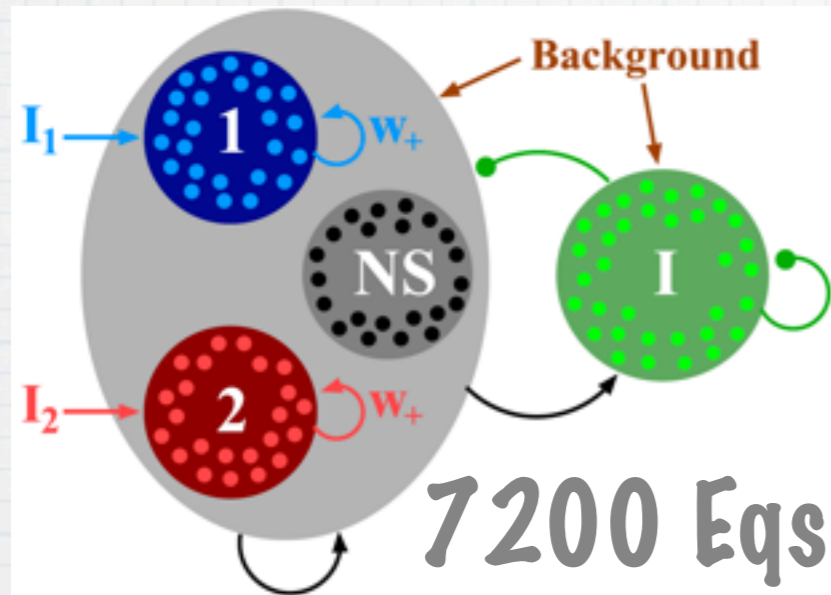
# Matches RT and % correct



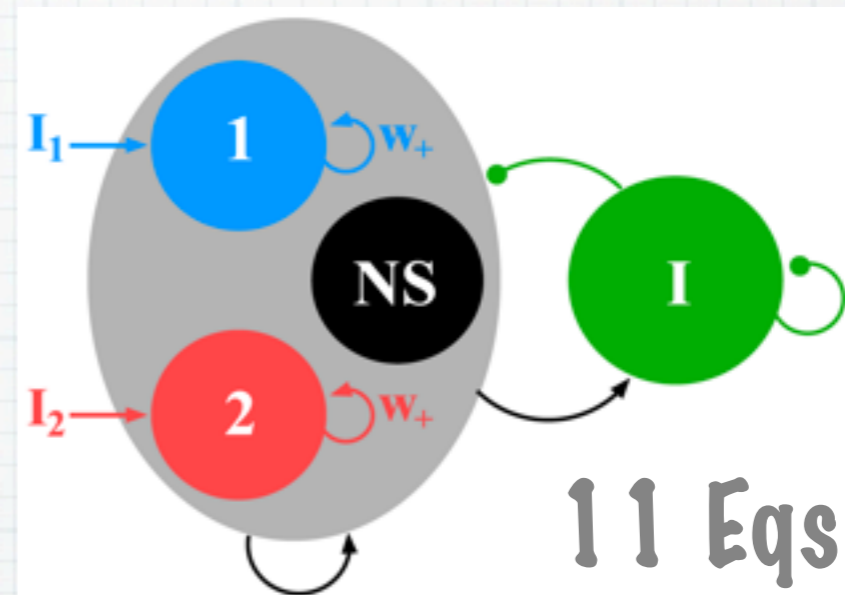
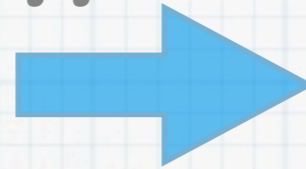
\* RT is longer and more variable when coherence is low. Neurometric threshold is 8.4 or 10.4% coherence for RT and 1s delay, respectively. Wang '01



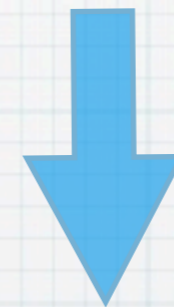
# Mean-field reduction



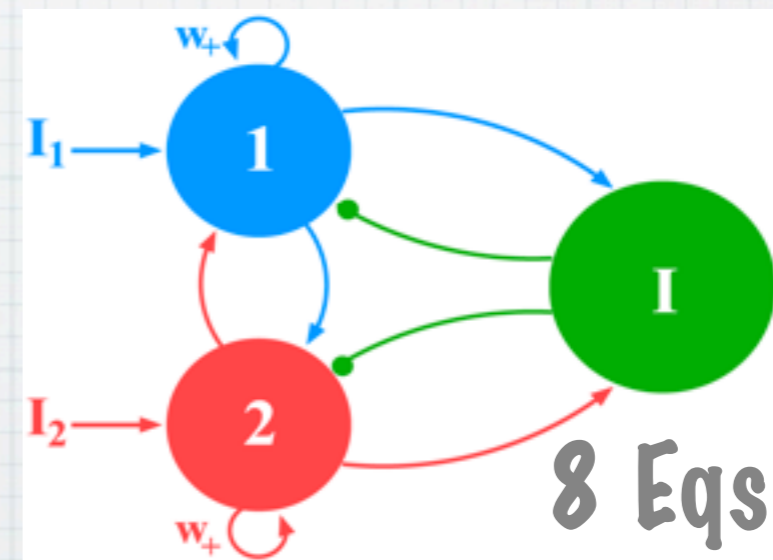
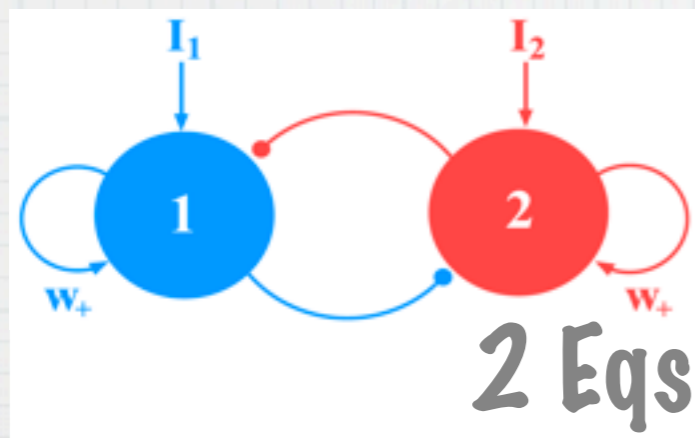
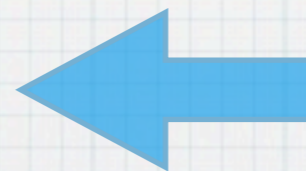
Mean-field approach



Simplified FI curves and constant NS cells



Only NMDA dynamics

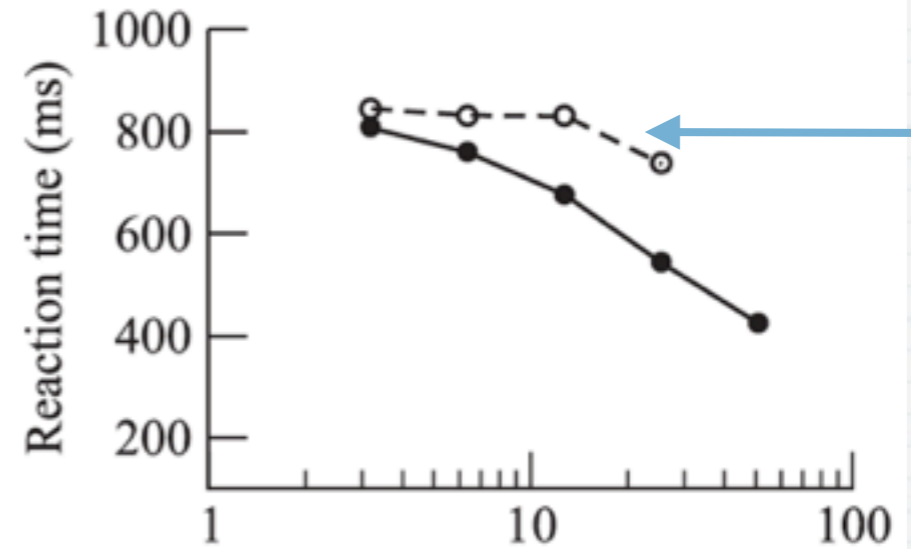
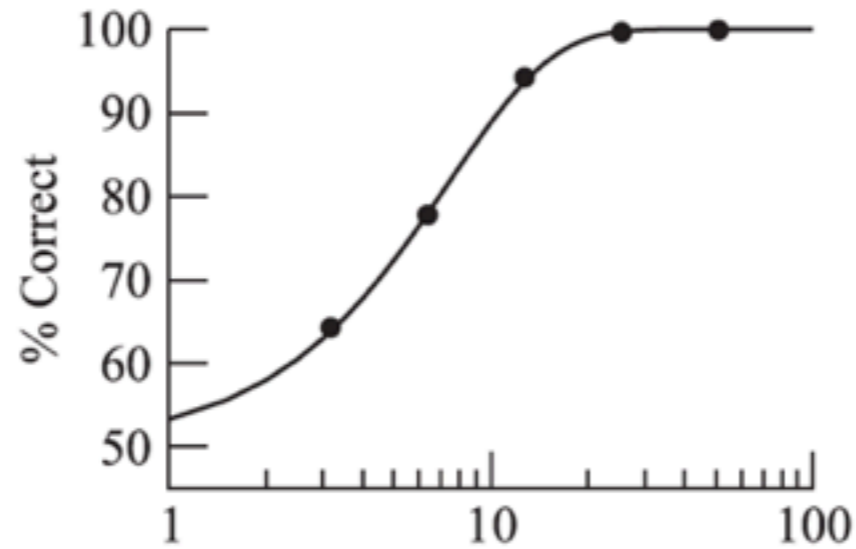


Wong & Wang '06

\* Results in two-variable model amenable to analysis

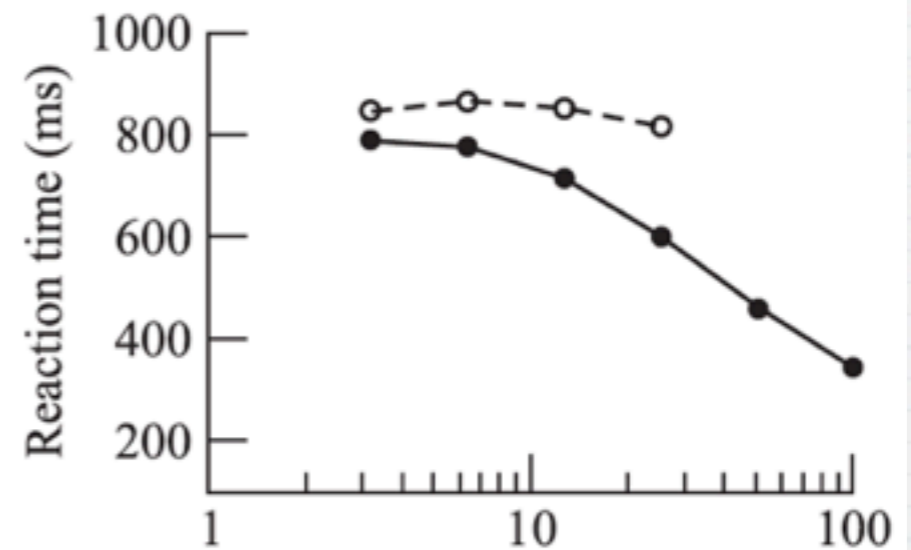
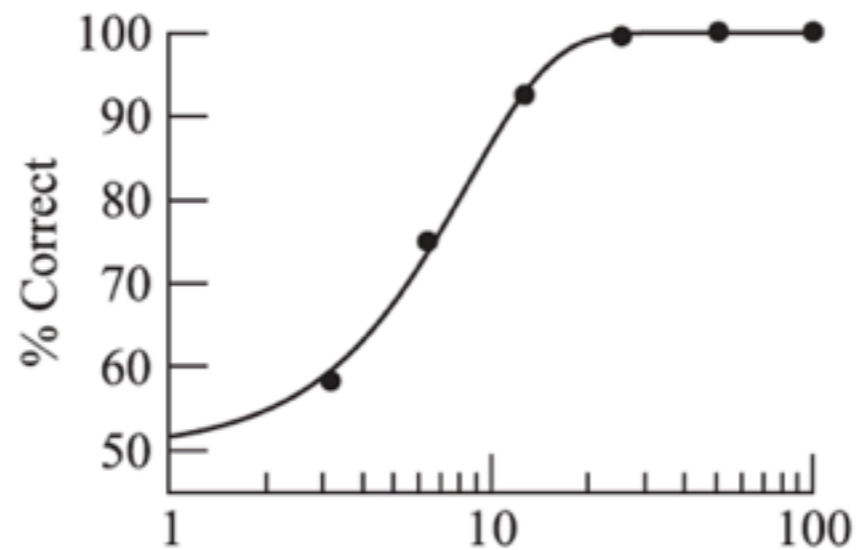
# 2D model fits the data

Experimental data

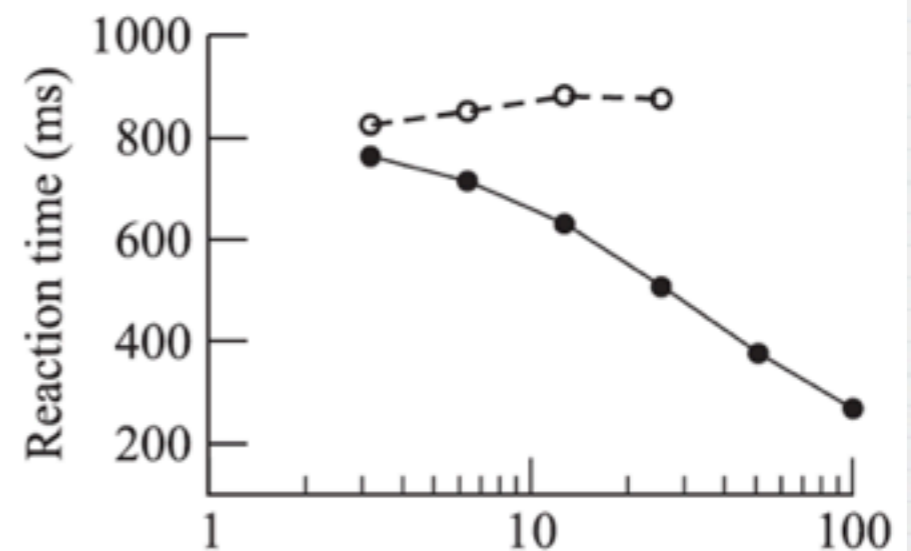
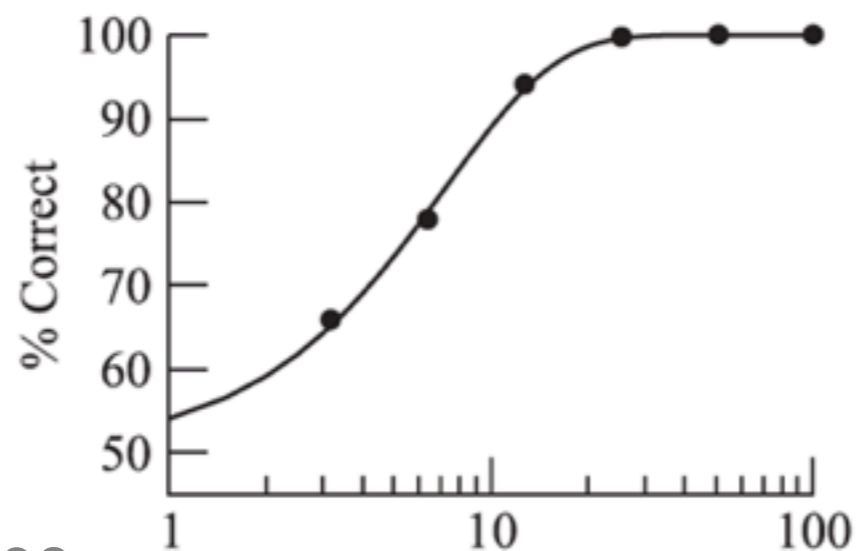


Error trials

Spiking neuronal network model



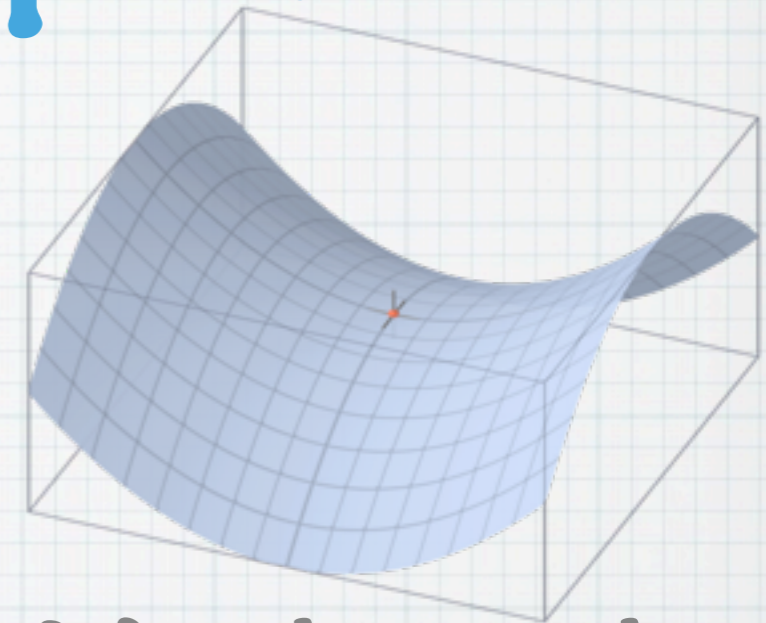
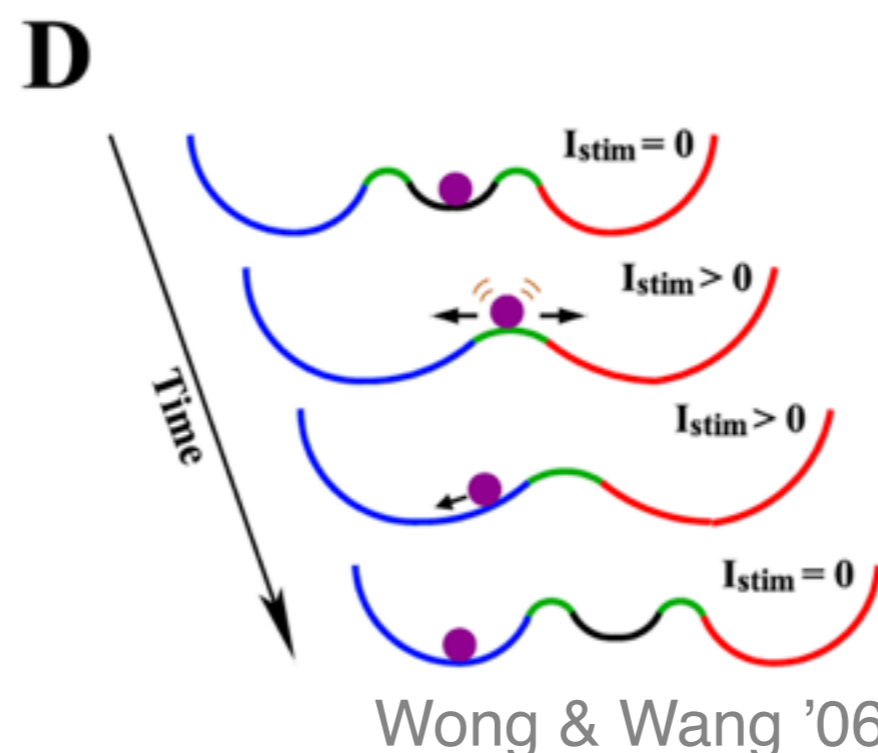
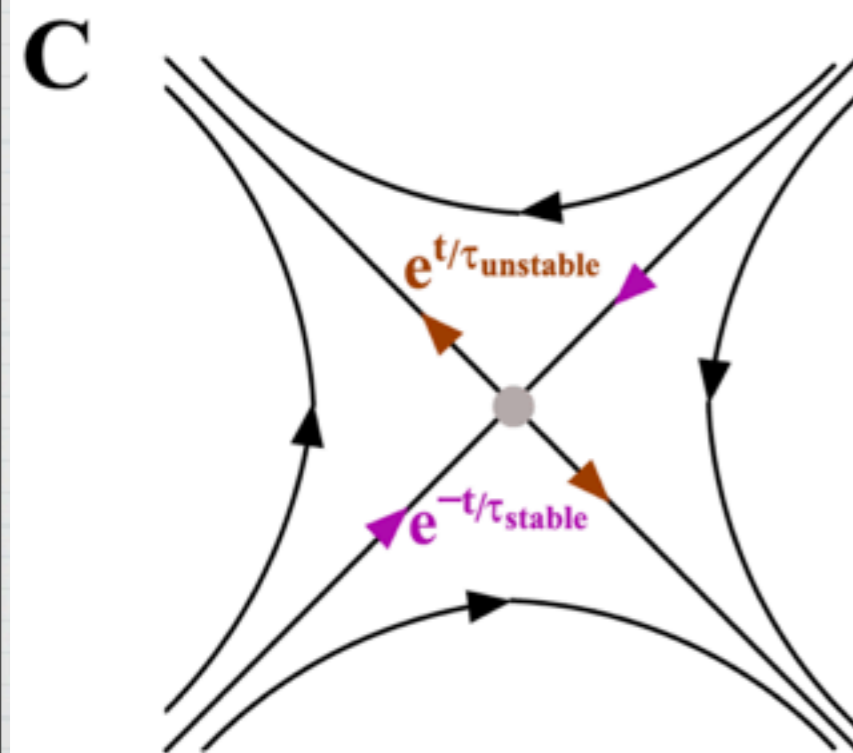
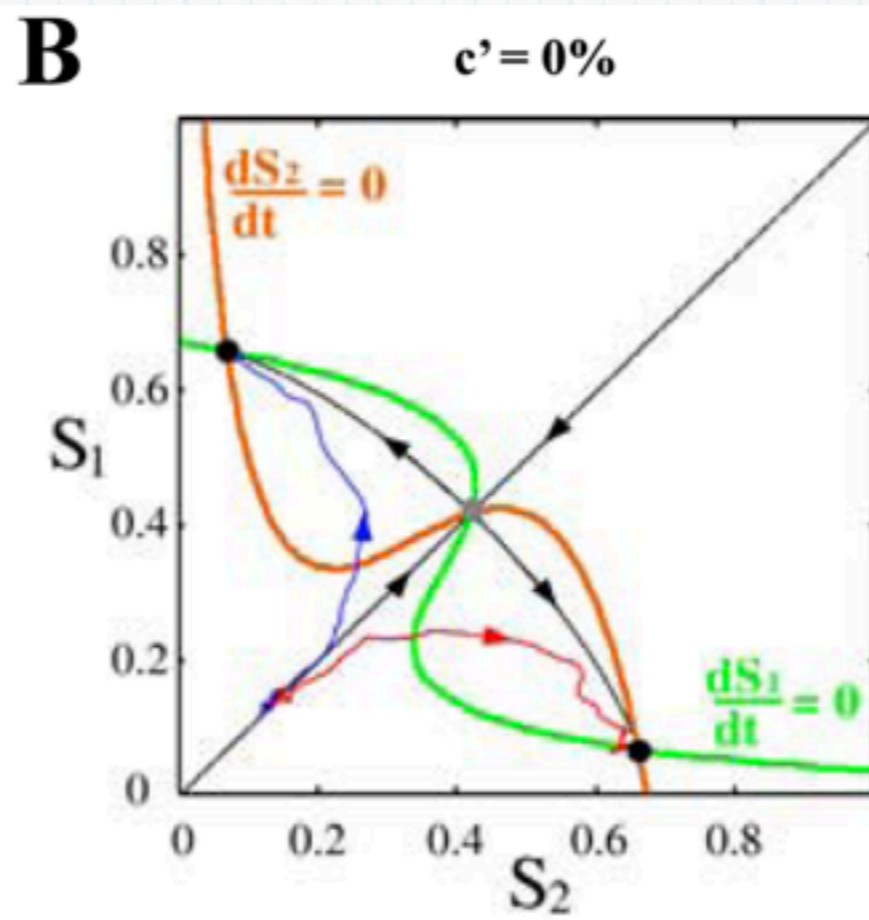
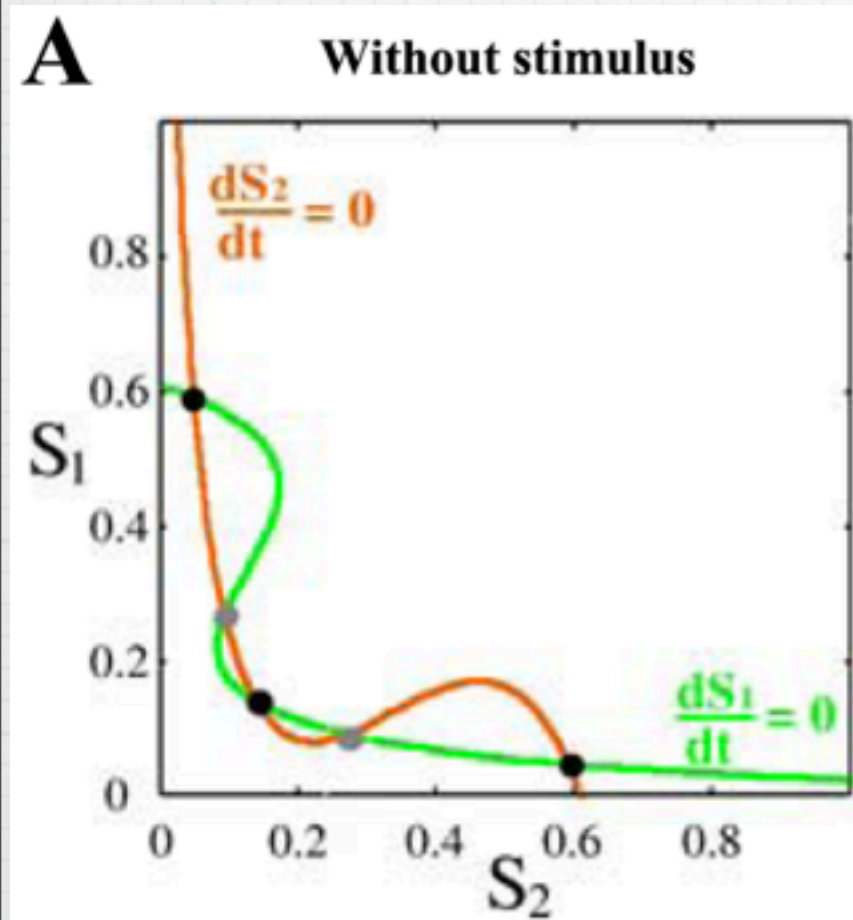
Reduced two-variable model



Wong & Wang '06



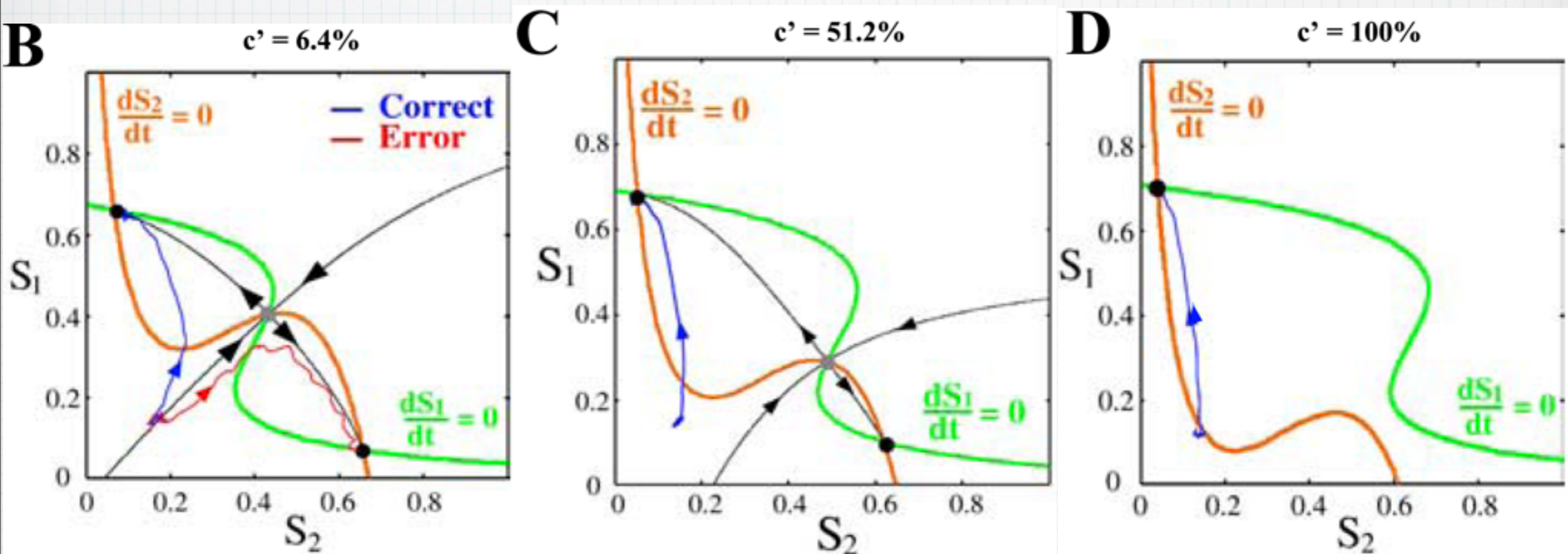
# 2D model's phase-plane



Middle stable point becomes a saddle-point, which defines a boundary between two other stable points' basins of attraction.



# Role of increasing coherence

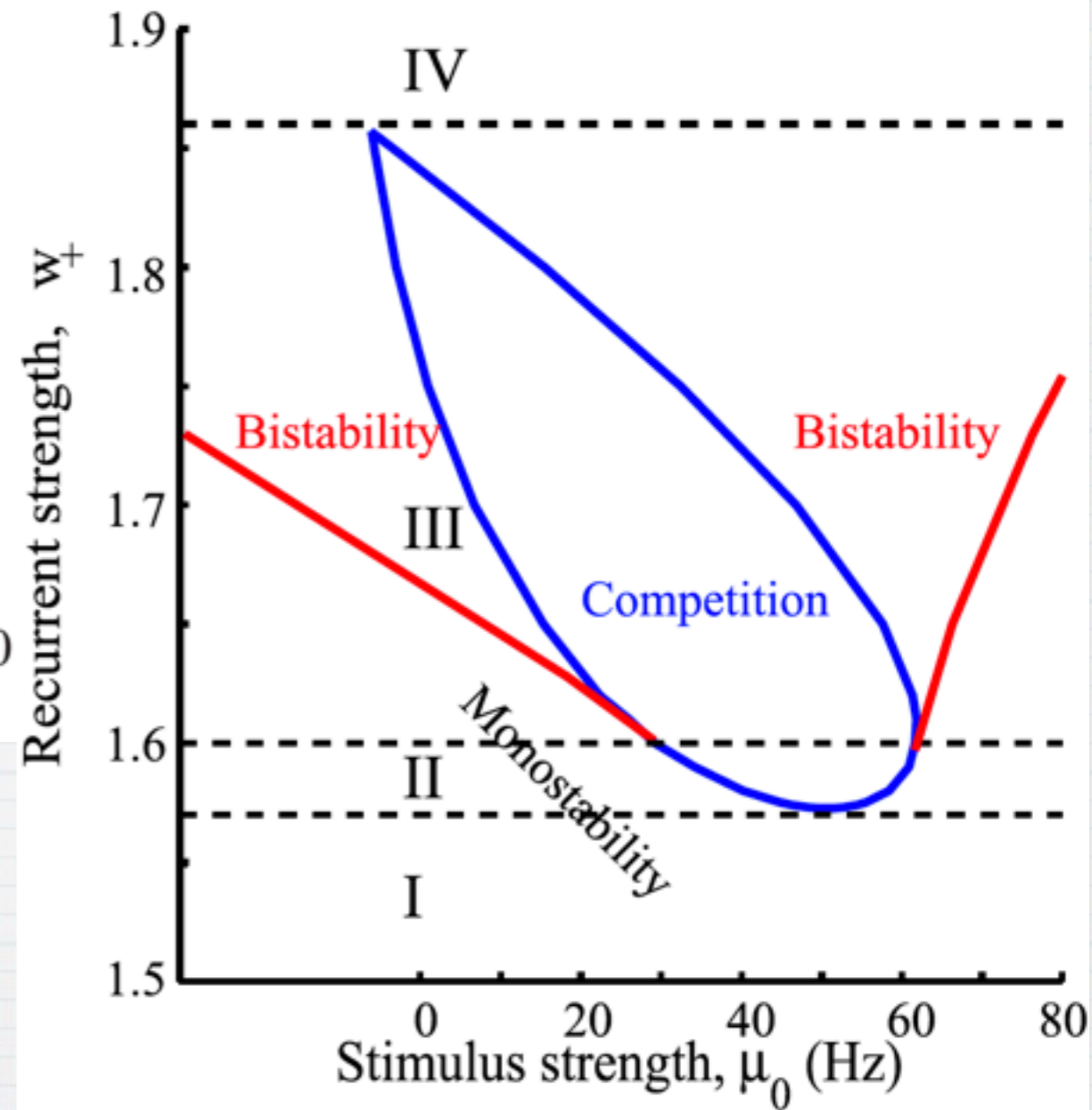
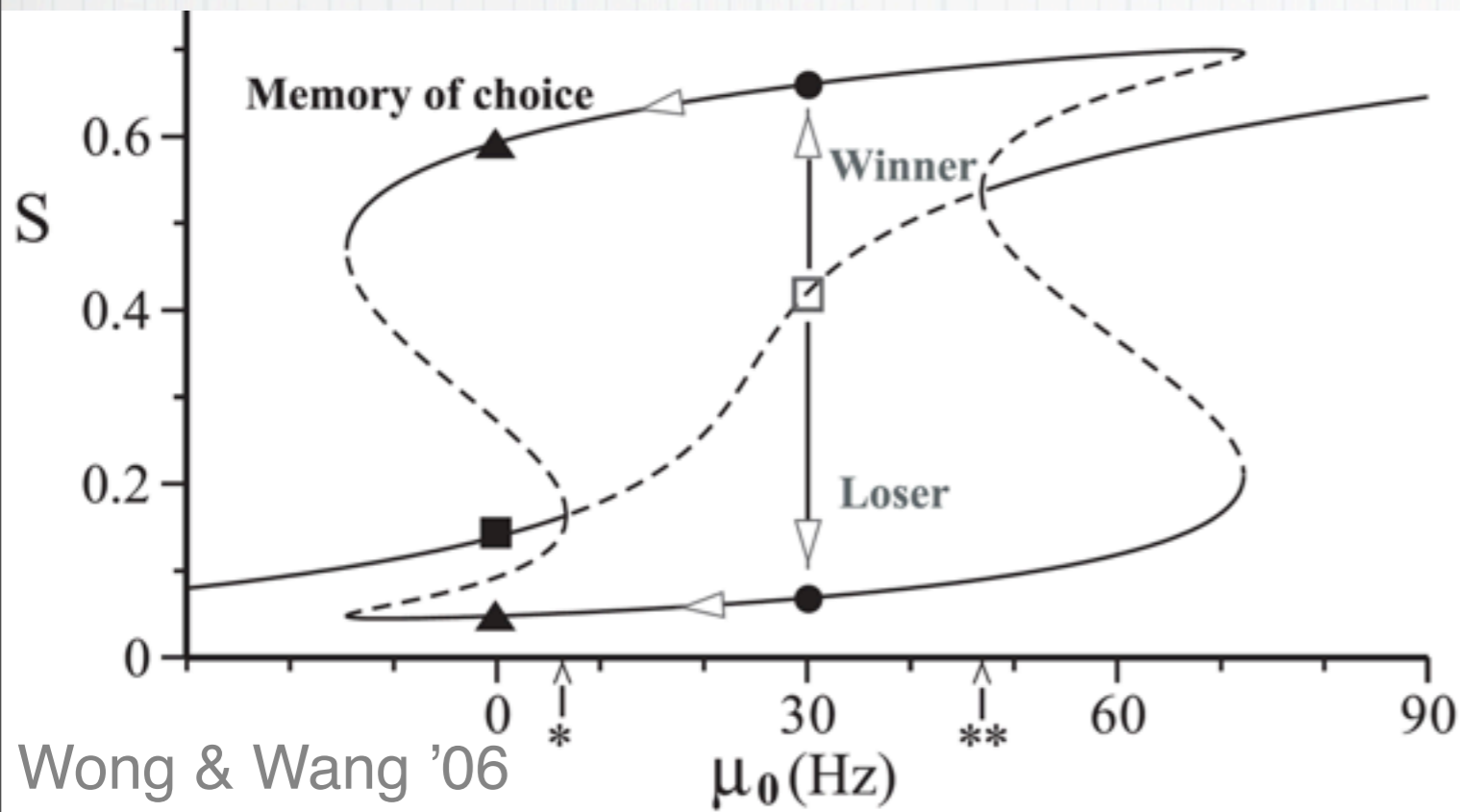


Wong & Wang '06

- \* At sufficiently high coherence, the trajectory always goes to the favored attractor.
- \* At even higher coherences, the unfavored attractor disappears.



# Bifurcation diagram



\* Monostable: 1 stable point

\* Bistable: 2 stable points

\* Competition: No hysteresis



# Next week

- \* **Balanced networks**