

# One dimensional dynamics of attention and decision making in area LIP

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# The Dynamics of Attention

- Goal: Top Down Attention



- Distractor: Bottom Up Attention

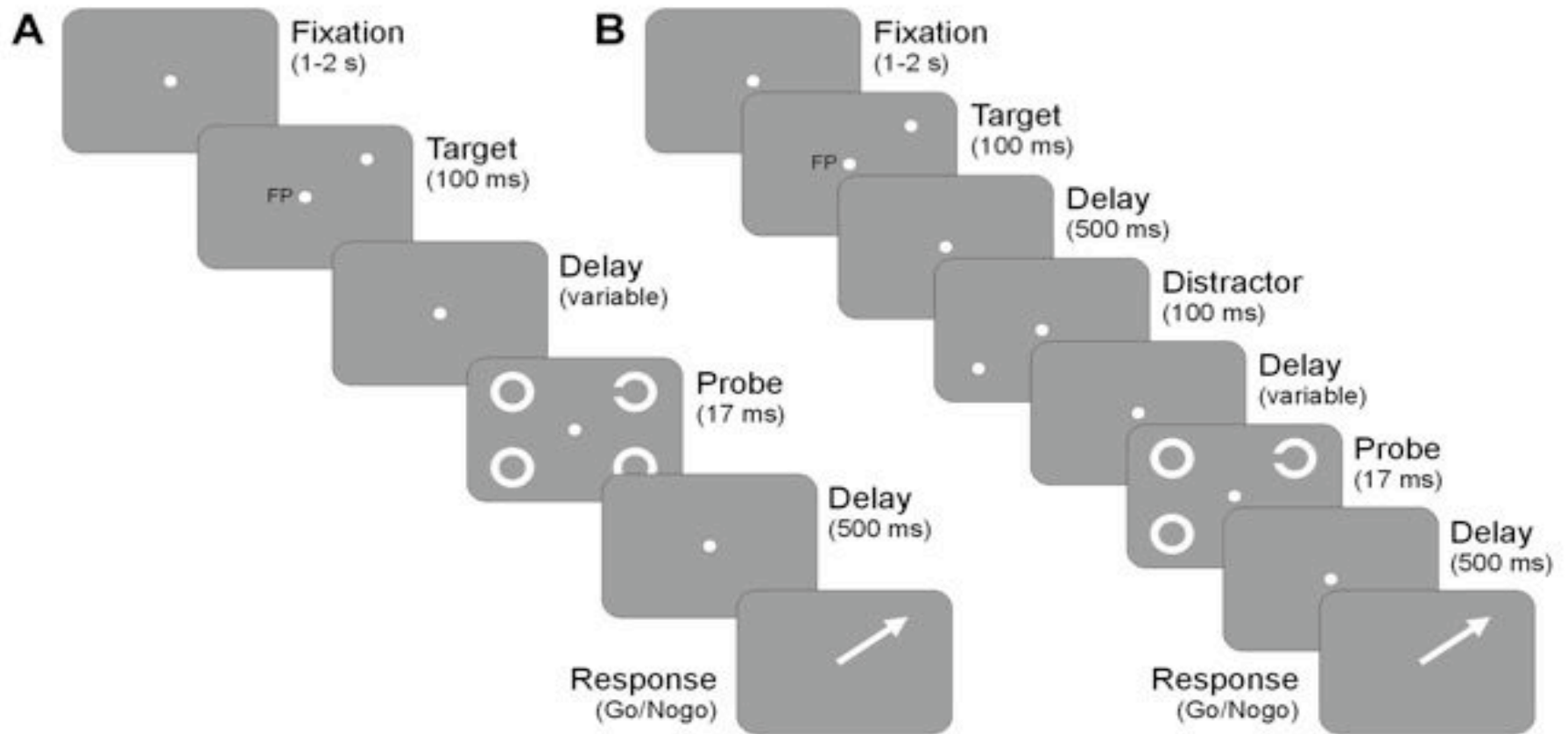


- Top Down wins back Attention

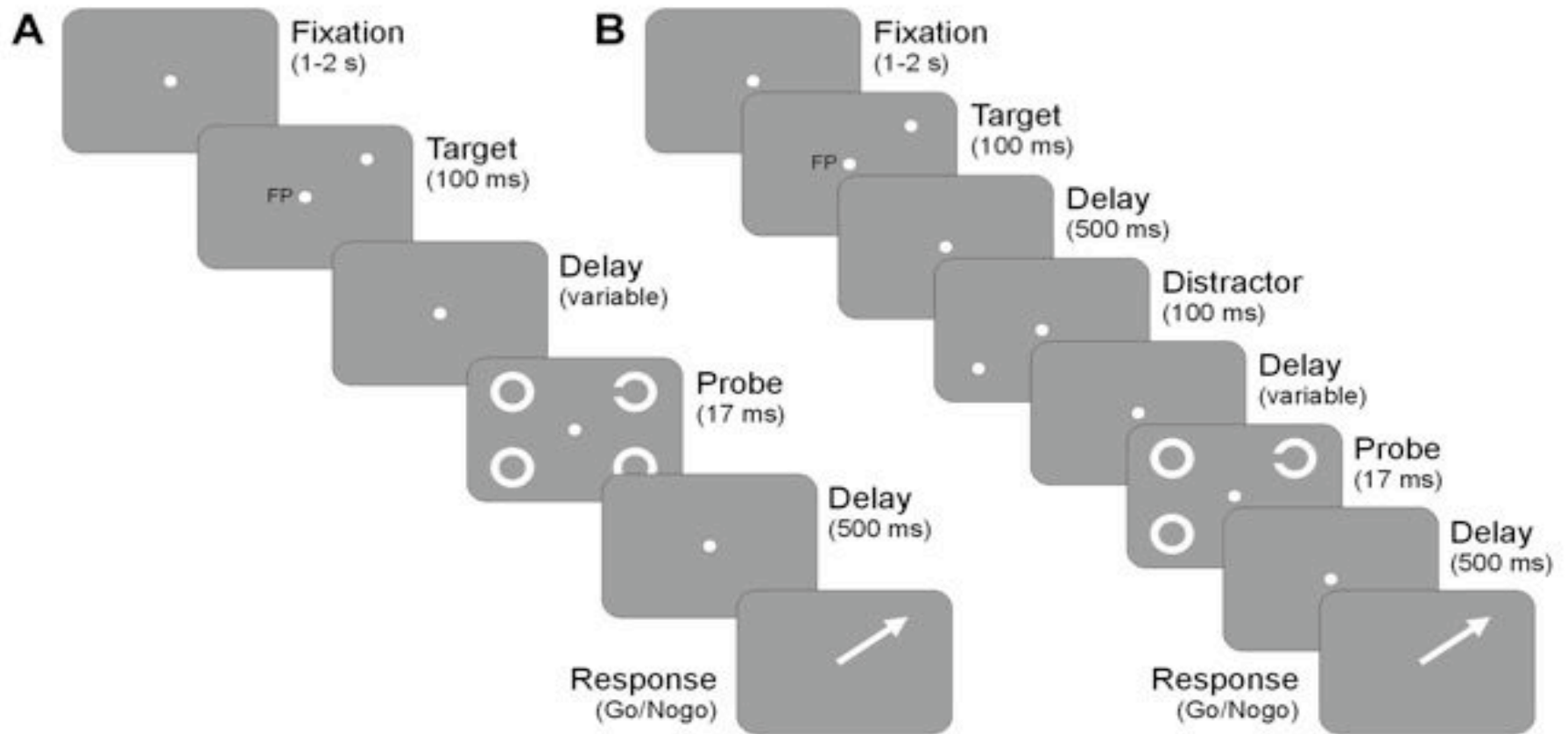


- What type of neuronal dynamics underlies this shifting attentional dynamics?

# The task (Bisley and Goldberg, Science, 2003):



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The locus of attention moves to the distractor for then returns back to the target within 375 ms.

# Lateral Intraparietal Cortex

Motor Planning:

Snyder et. al. 1997

Decision Making:

Platt & Glimcher 1999

Shadlen & Newsome 2001

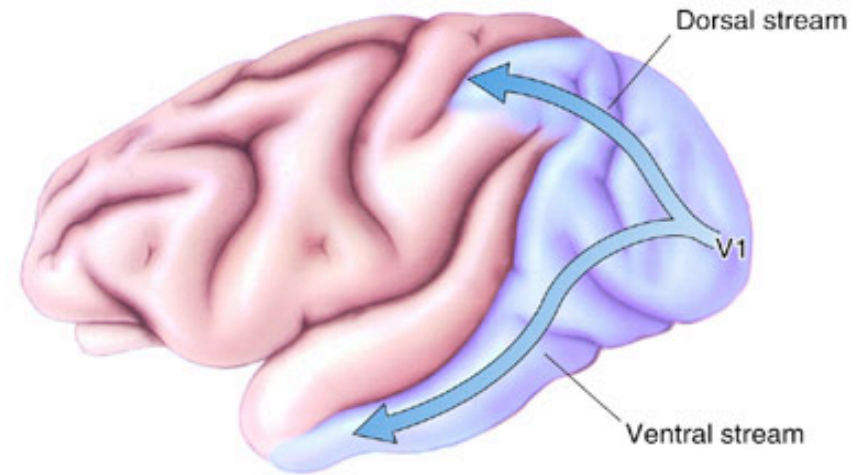
Reward:

Sugrue et.al. 2004

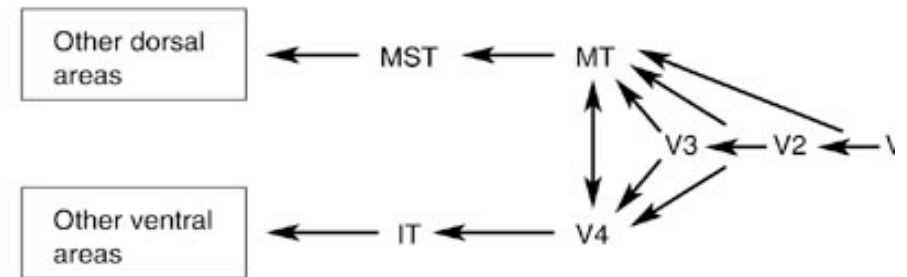
Dorris and Glimcher 2004

Attention:

Gottlieb et. al., 1998

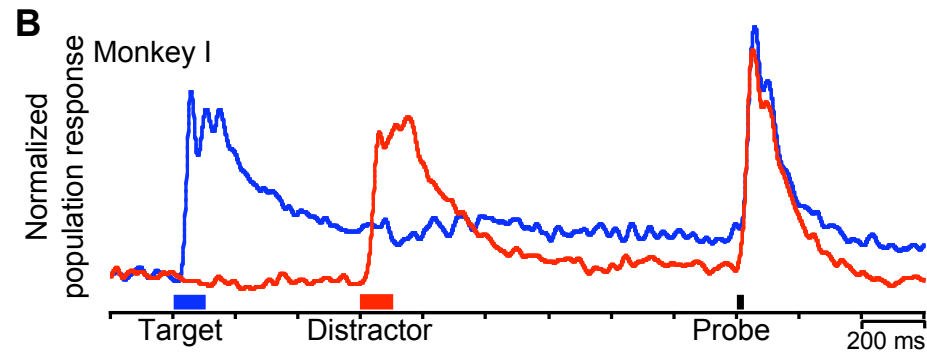


(a)

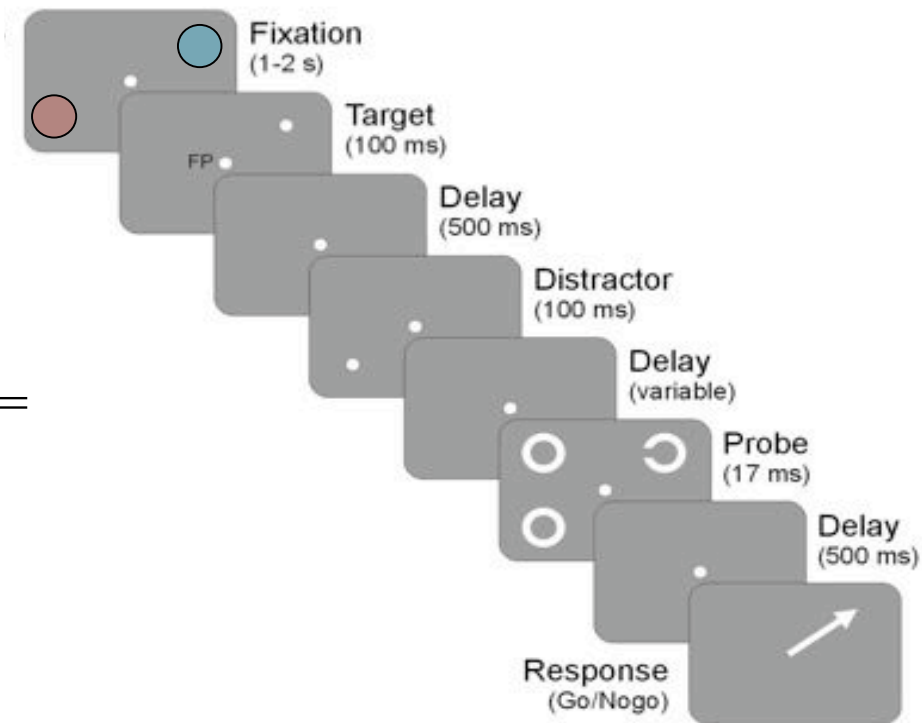


(c)

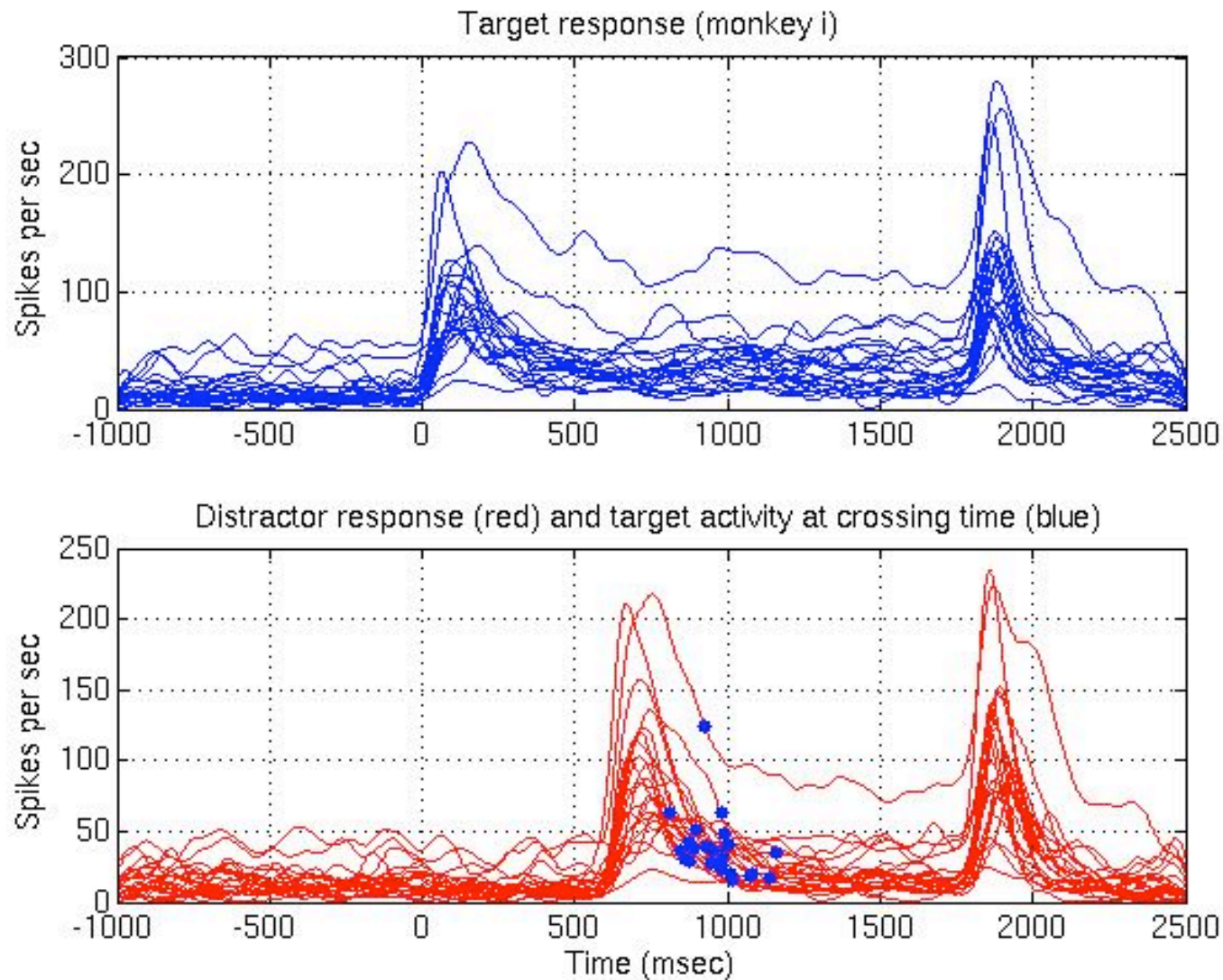
# Trial Average Population Responses



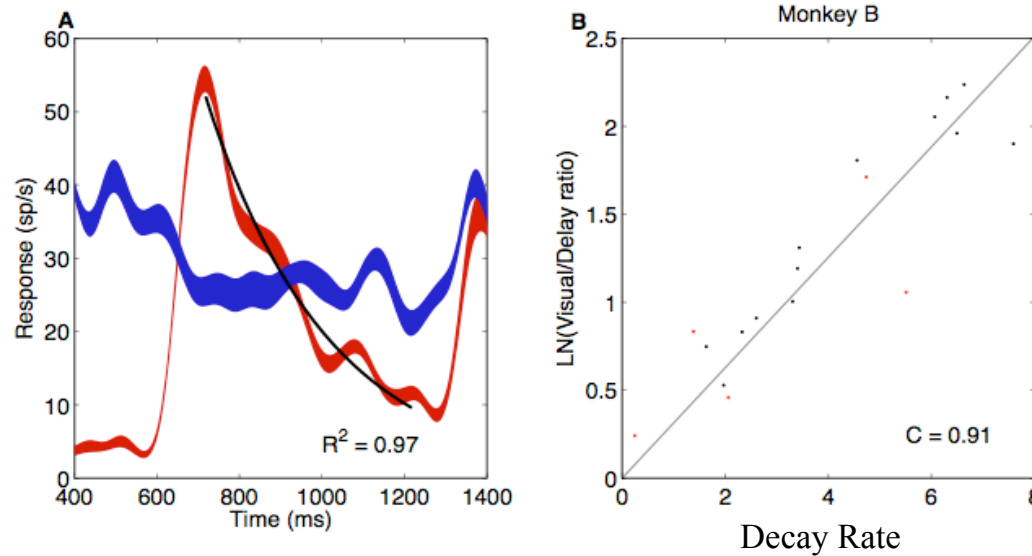
Locus of Attention =  
RF of neurons with  
Peak Activity  
in LIP



# Trial Average Single Neuron Response







Bisley, Goldberg 05

For each individual neuron, define

$V$  = peak visual response to distractor (Bottom Up Attention)

$\tau$  = decay time of response to distractor

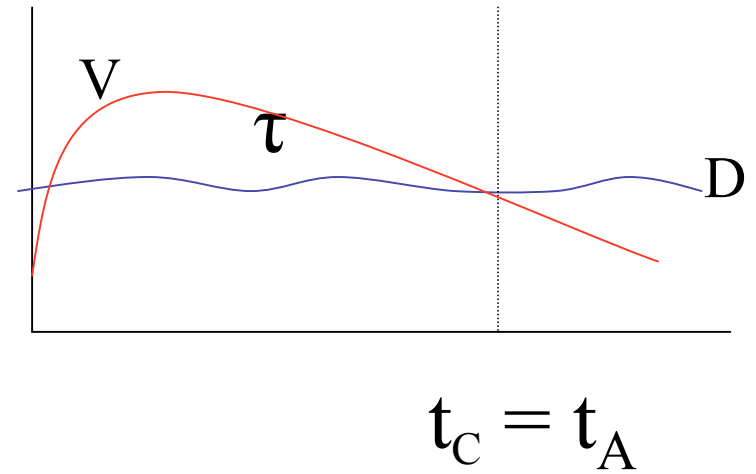
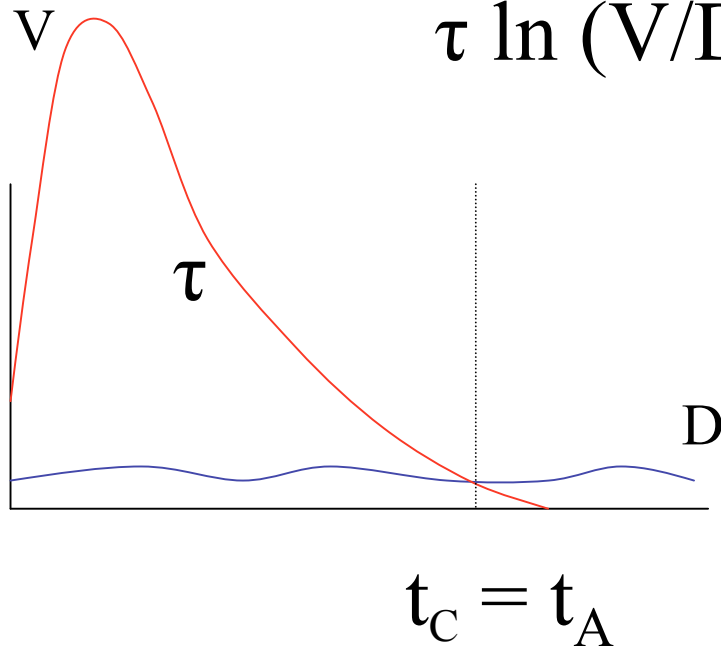
$D$  = delay period response to target (Top Down Attention)

If there is a common crossing time  $t_c$ , then  $V \exp(-t_c/\tau) = D$

Or equivalently,  $\ln(V/D) = t_c/\tau$



$$\tau \ln (V/D) = t_A : \text{WHY?}$$



An important and robust behavioral time scale is predicted by noisy and heterogeneous single neuron dynamics!

No network explanation is allowed - the recorded neurons don't talk to each other!

Any single neuron biophysics explanation would require fine tuning.

$$\tau \ln (V/D) = t_A : \text{WHY?}$$

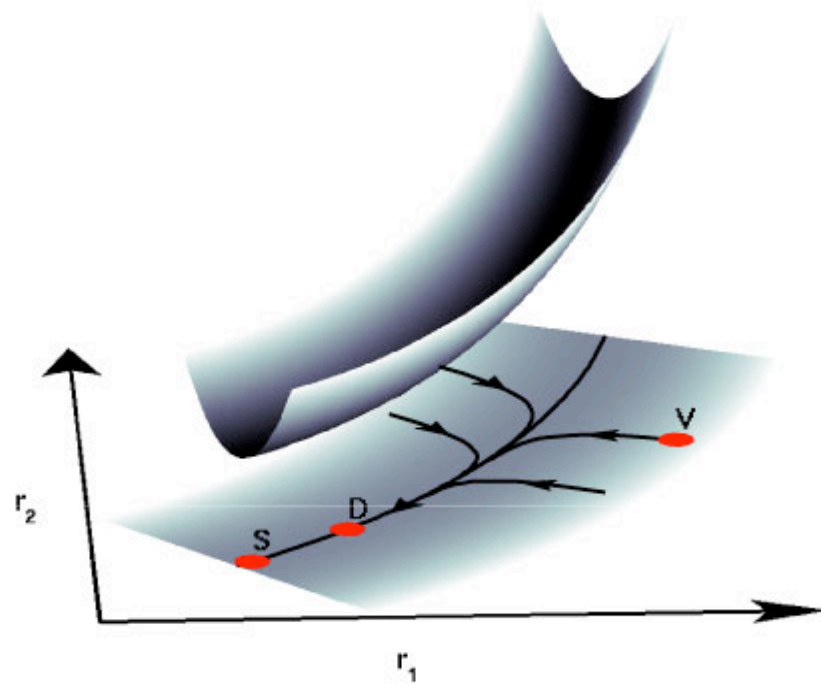
Network Dynamics: consider

population vector  $\mathbf{r}(t)$  of responses of neurons  
at time  $t$  after distractor shown in RF

population vector  $\mathbf{d}$  of responses of neurons in  
delay period after target shown in RF

common crossing time  $t_A$  means  $\mathbf{r}(t_A) = \mathbf{d}$

$\mathbf{r}(t_A) = \mathbf{d}$ : WHY?



- imagine  $\mathbf{r}(t)$ , once excited, quickly settles into a particular direction in firing rate space
- also imagine that the delay vector  $\mathbf{d}$  lies in this direction as well, so they intersect
- this scenario does not require fine tuning

$$\mathbf{r}(t_A) = \mathbf{d}: \text{ WHY?}$$

This will arise from network dynamics if:

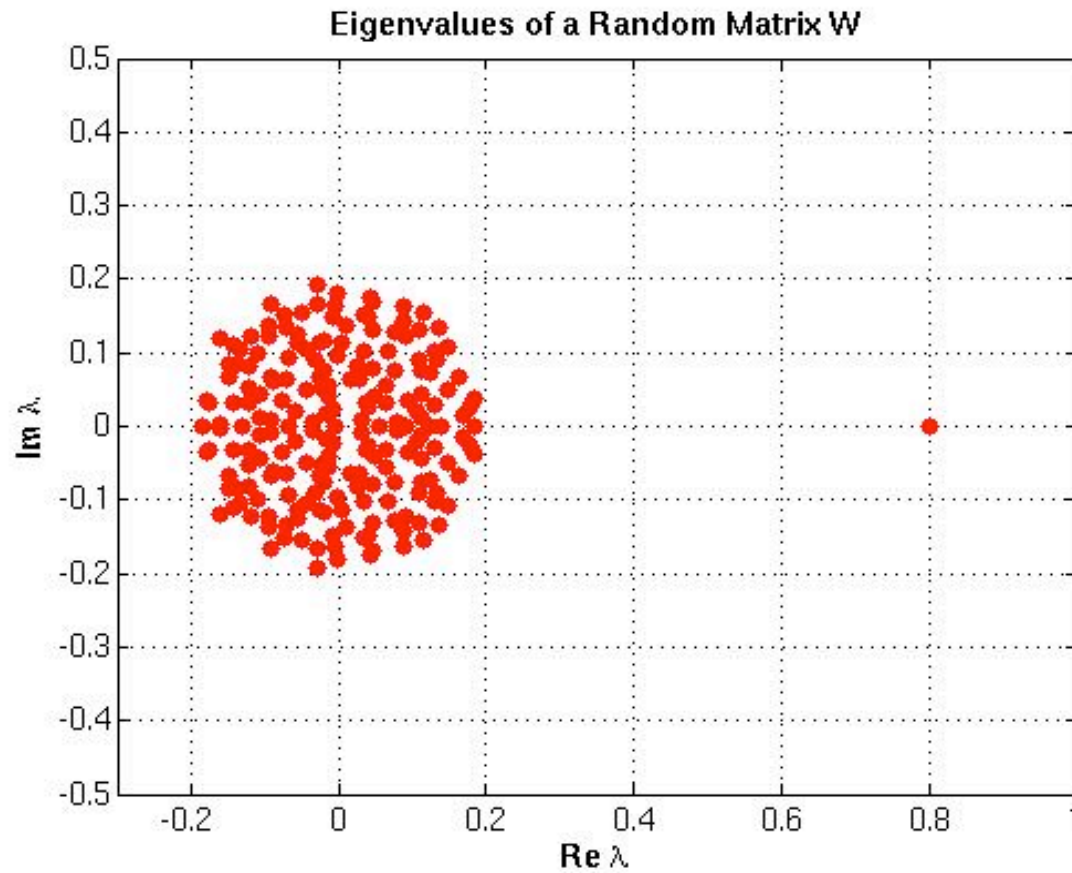
- (1) Dynamics of decay has one slow mode  $\mathbf{m}_s$ , all other modes decay quickly
- (2) This slow mode is also the dominant mode in the sustained, delay dynamics

$$w/N \begin{pmatrix} 1 & 1 & \dots & 1 & 1 \\ 1 & 1 & \dots & 1 & 1 \\ \cdot & & & & \cdot \\ \cdot & & & & \cdot \\ 1 & 1 & \dots & 1 & 1 \end{pmatrix} \quad \text{Slow mode:} \quad \begin{pmatrix} 1 \\ 1 \\ \cdot \\ \cdot \\ 1 \end{pmatrix} \quad \begin{matrix} \mathbf{r}(t) \propto \mathbf{m}_s \\ \mathbf{d} \propto \mathbf{m}_s \end{matrix}$$

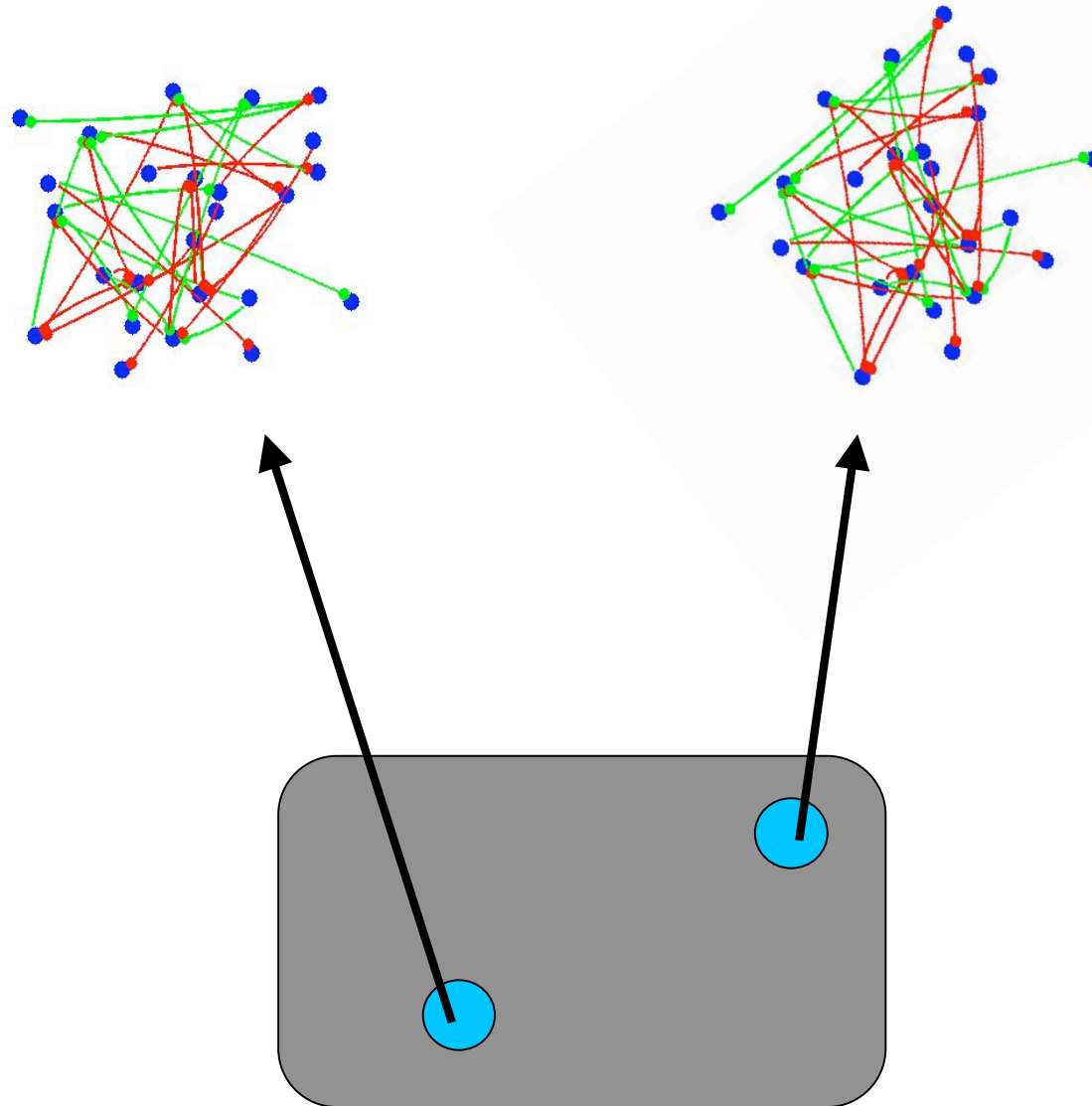
Eigenvector = Preferred Pattern or Mode of Activity across Neurons

Eigenvalue = Amount of feedback to that pattern (larger value  $\rightarrow$  slower decay)

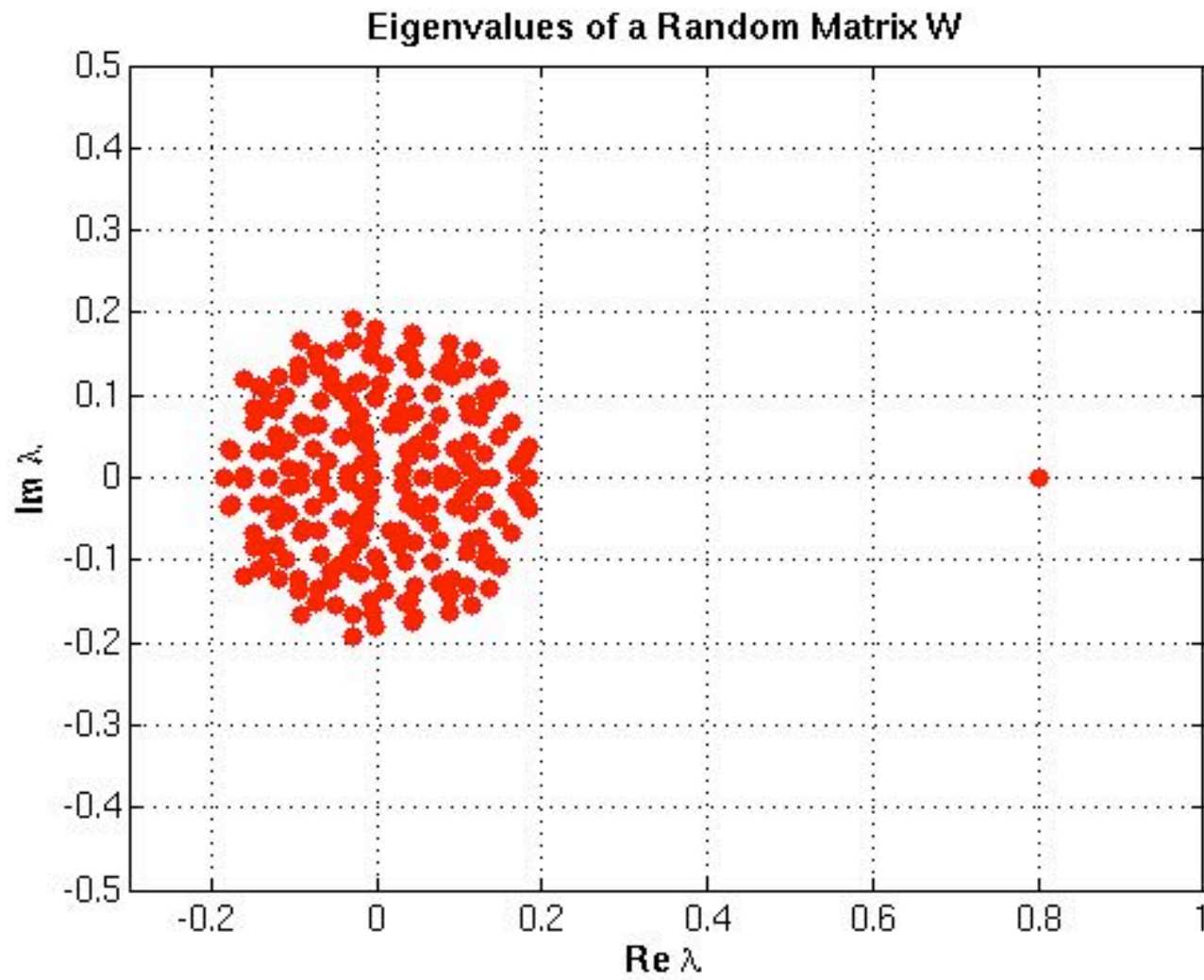
One dimensional dynamics without fine tuning.



# The Full Problem

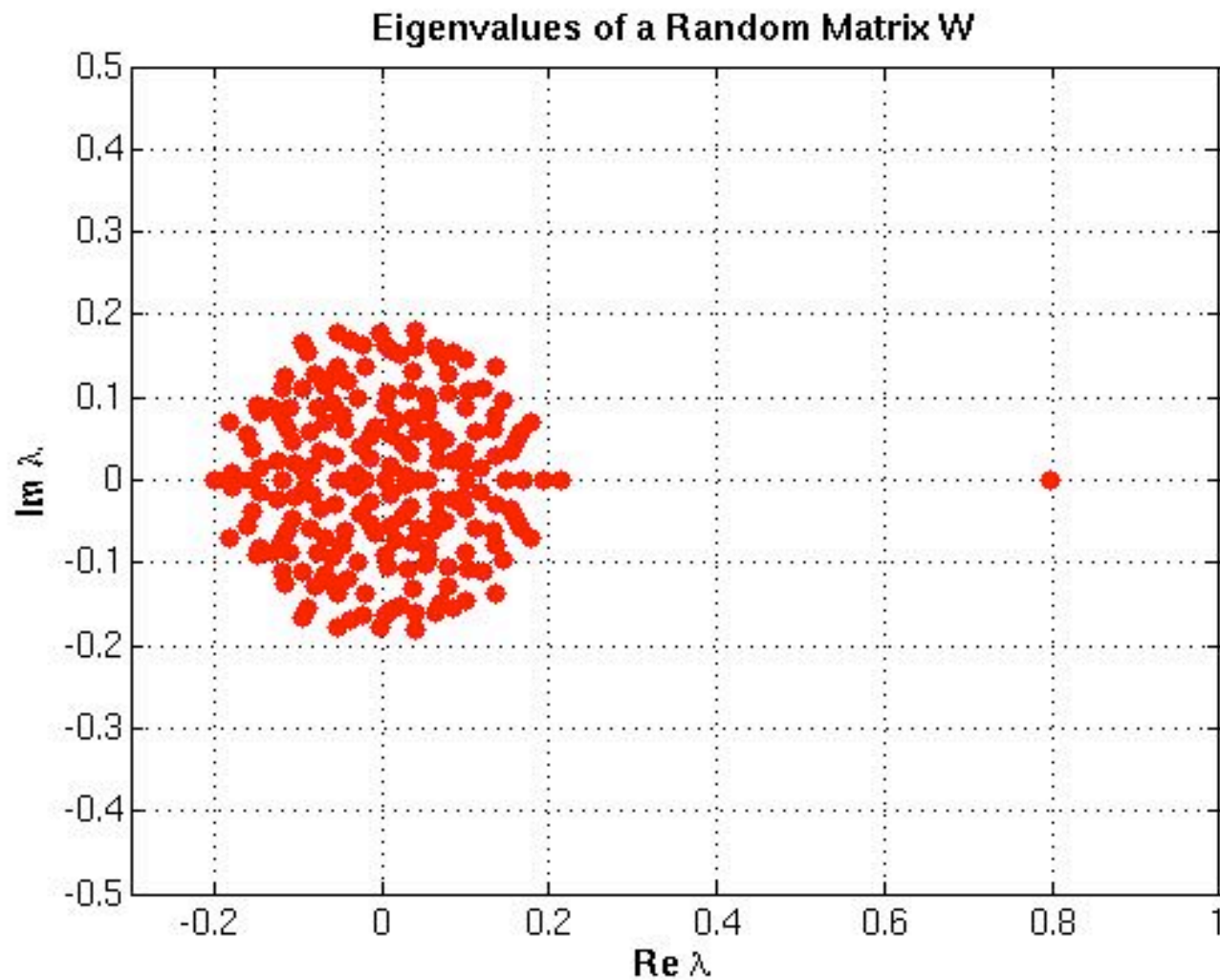


The time scale of attentional switching is robust.

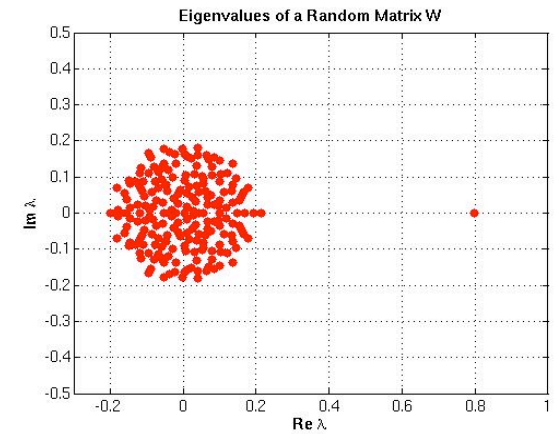
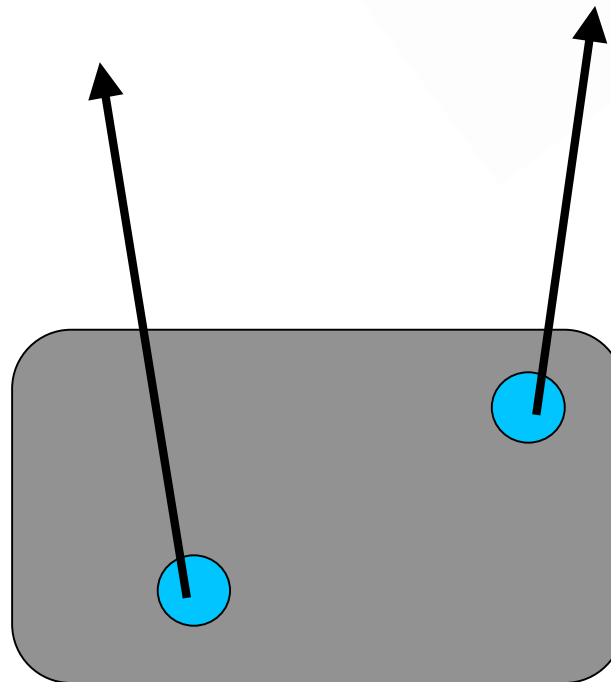
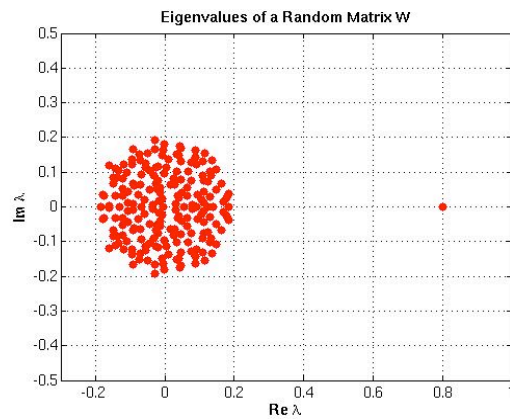
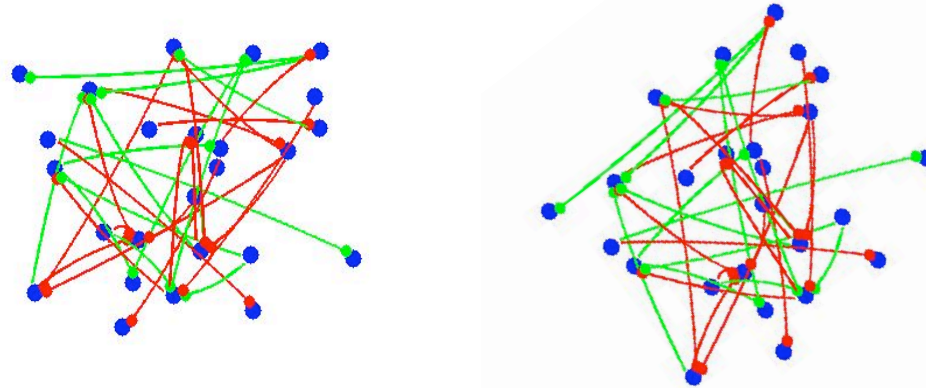




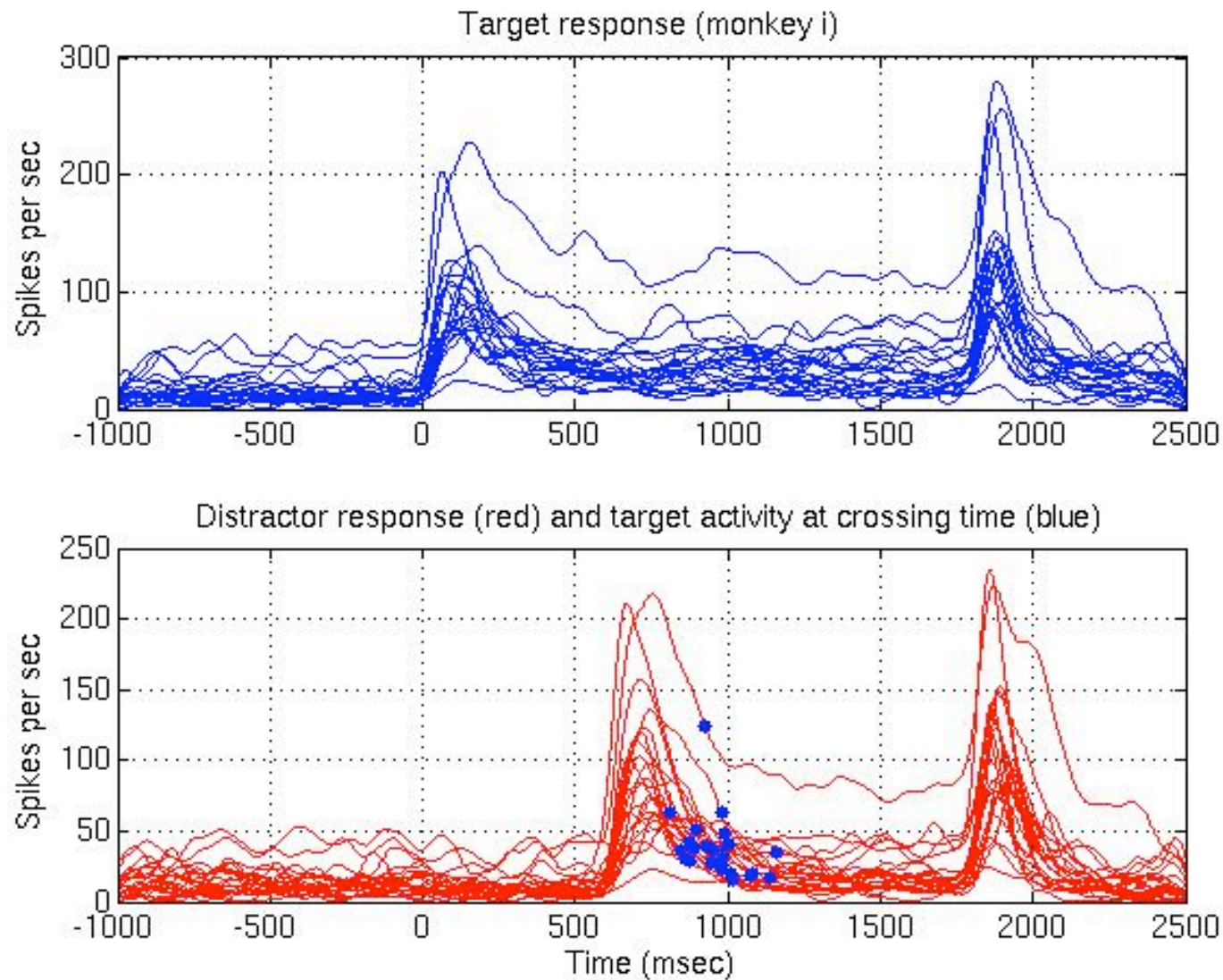
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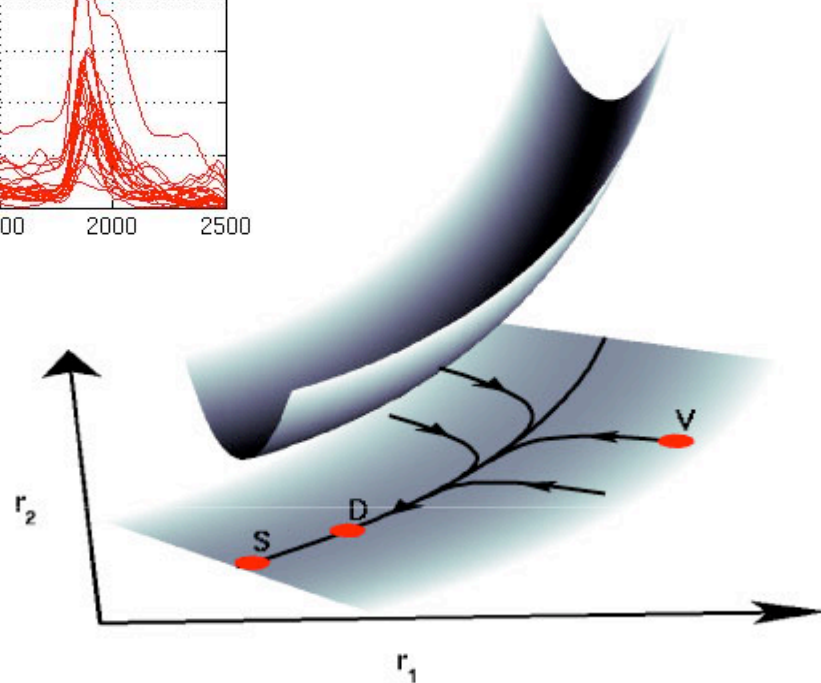
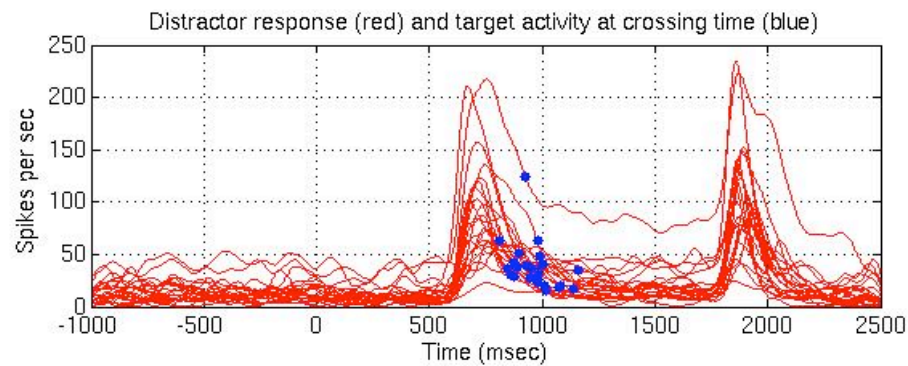
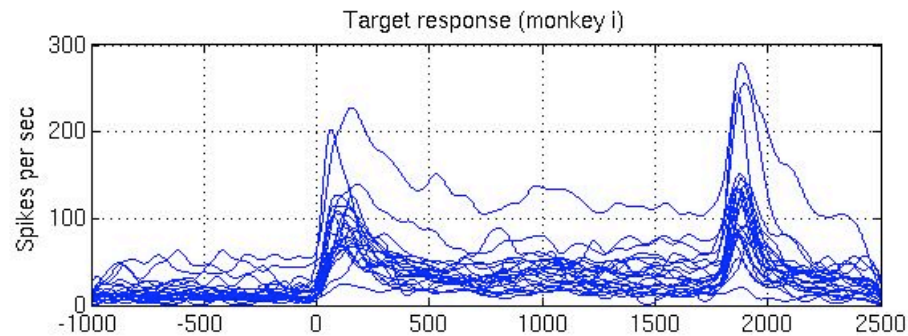
# The Full Solution



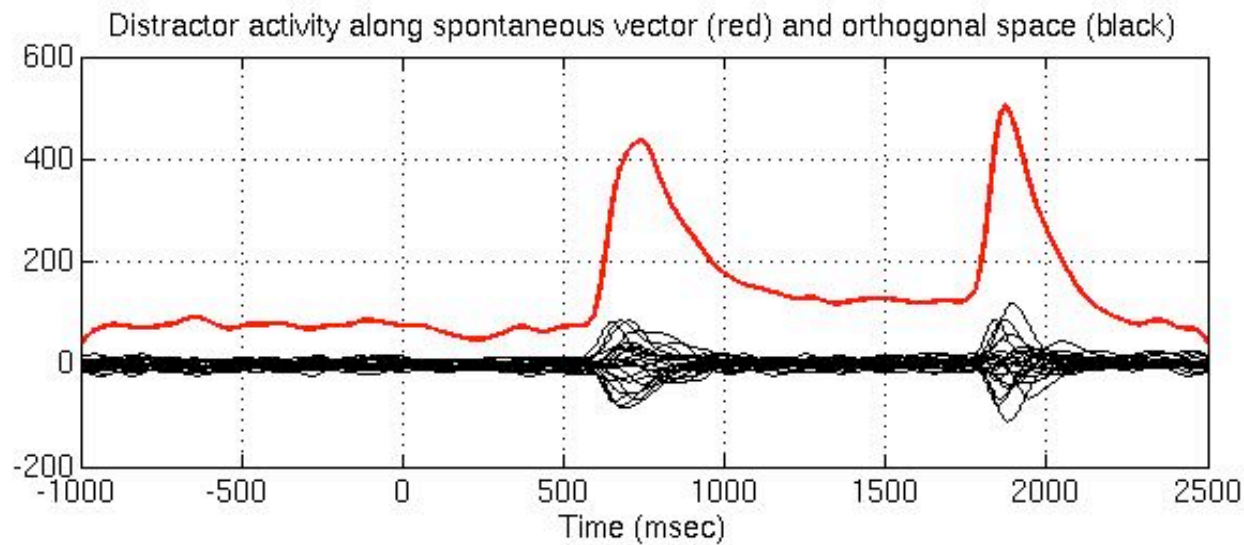
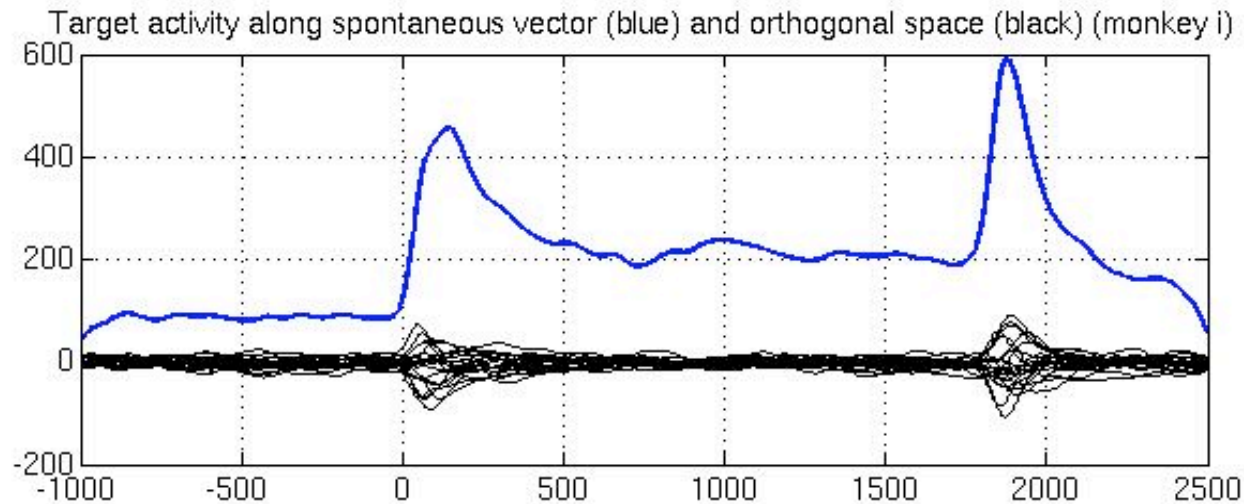
# Prediction: Original Single Neuron Data



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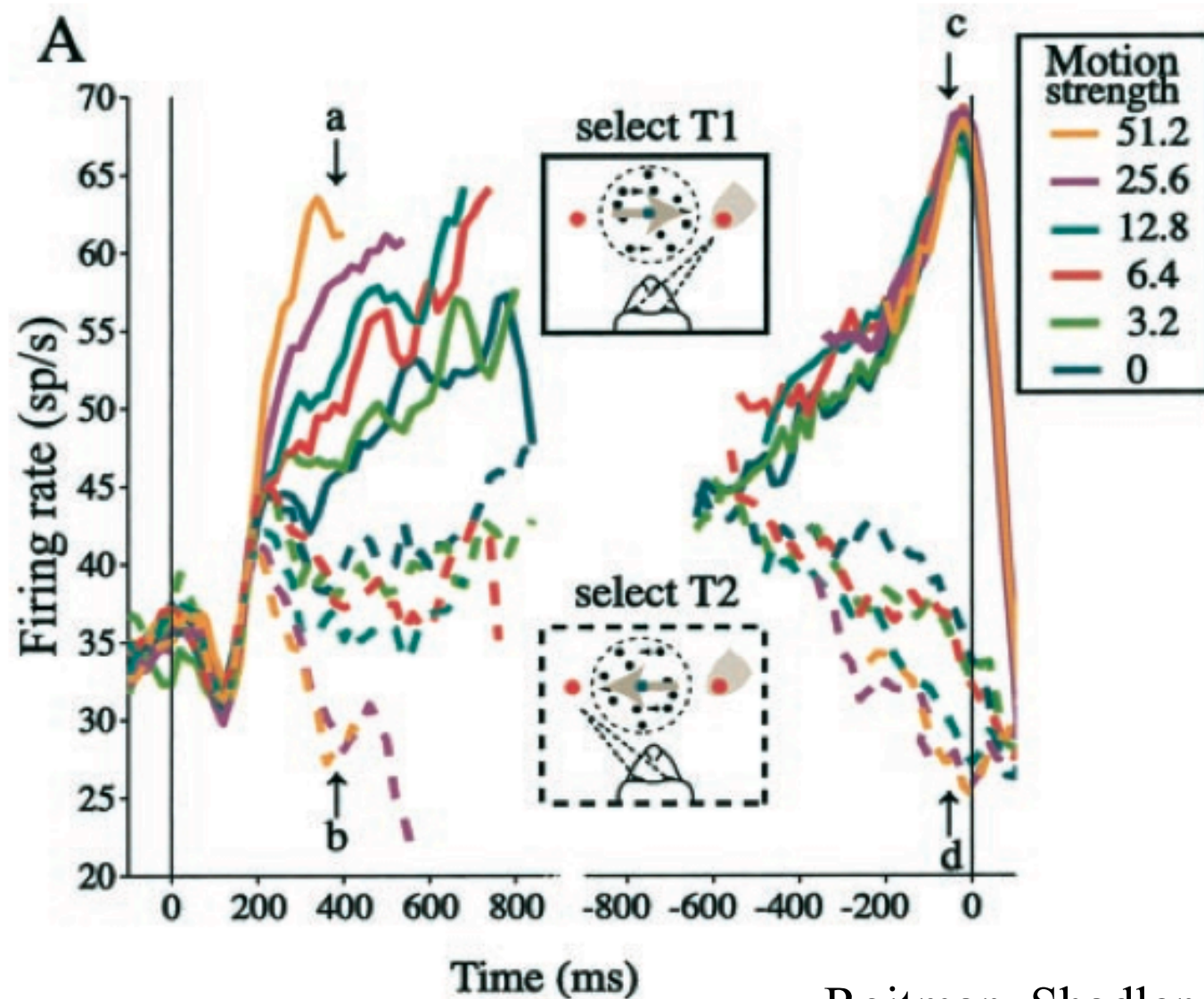


# Activity along spontaneous versus other directions



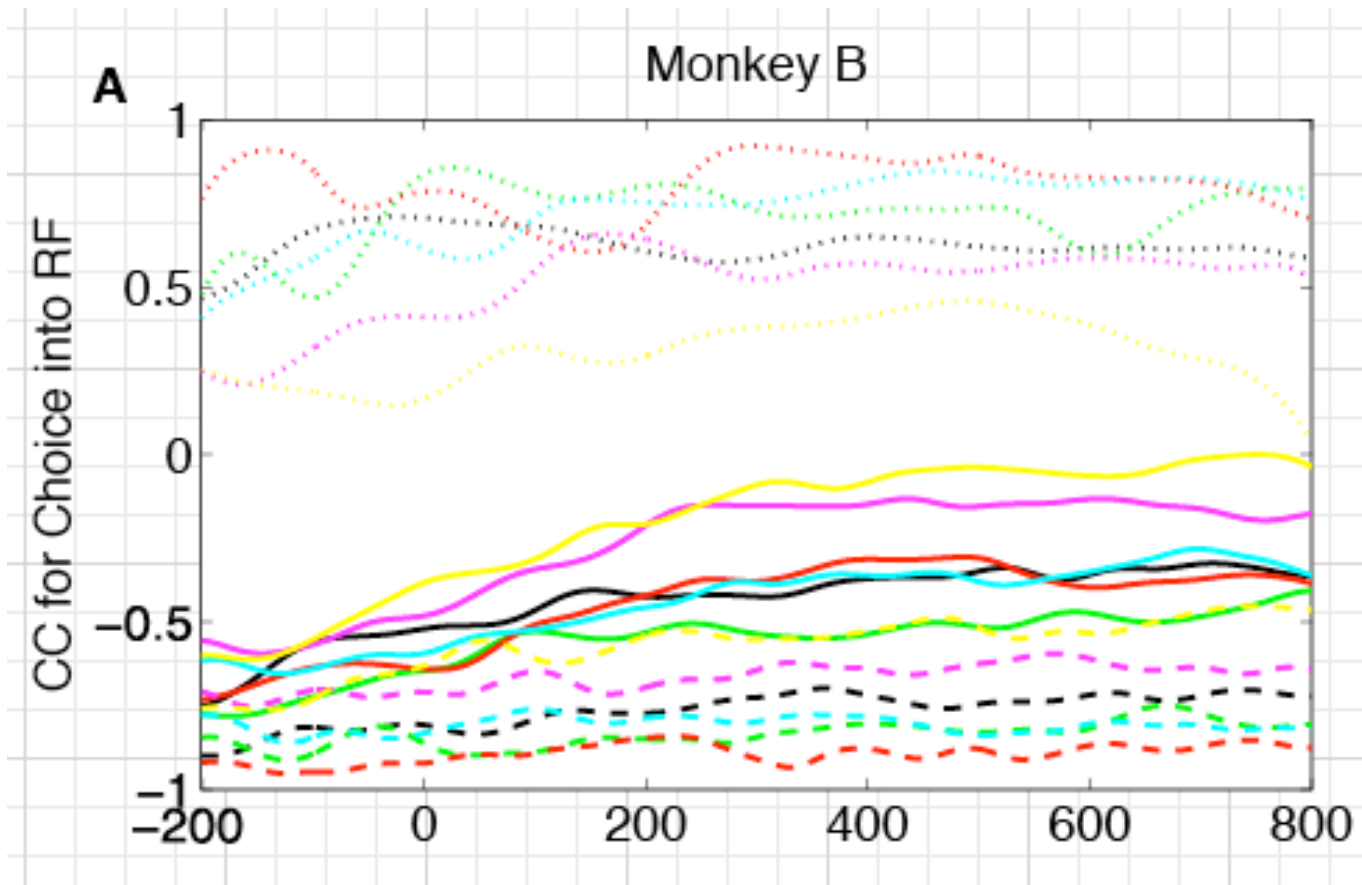


# Same Neurons, Different Task: Decision Making



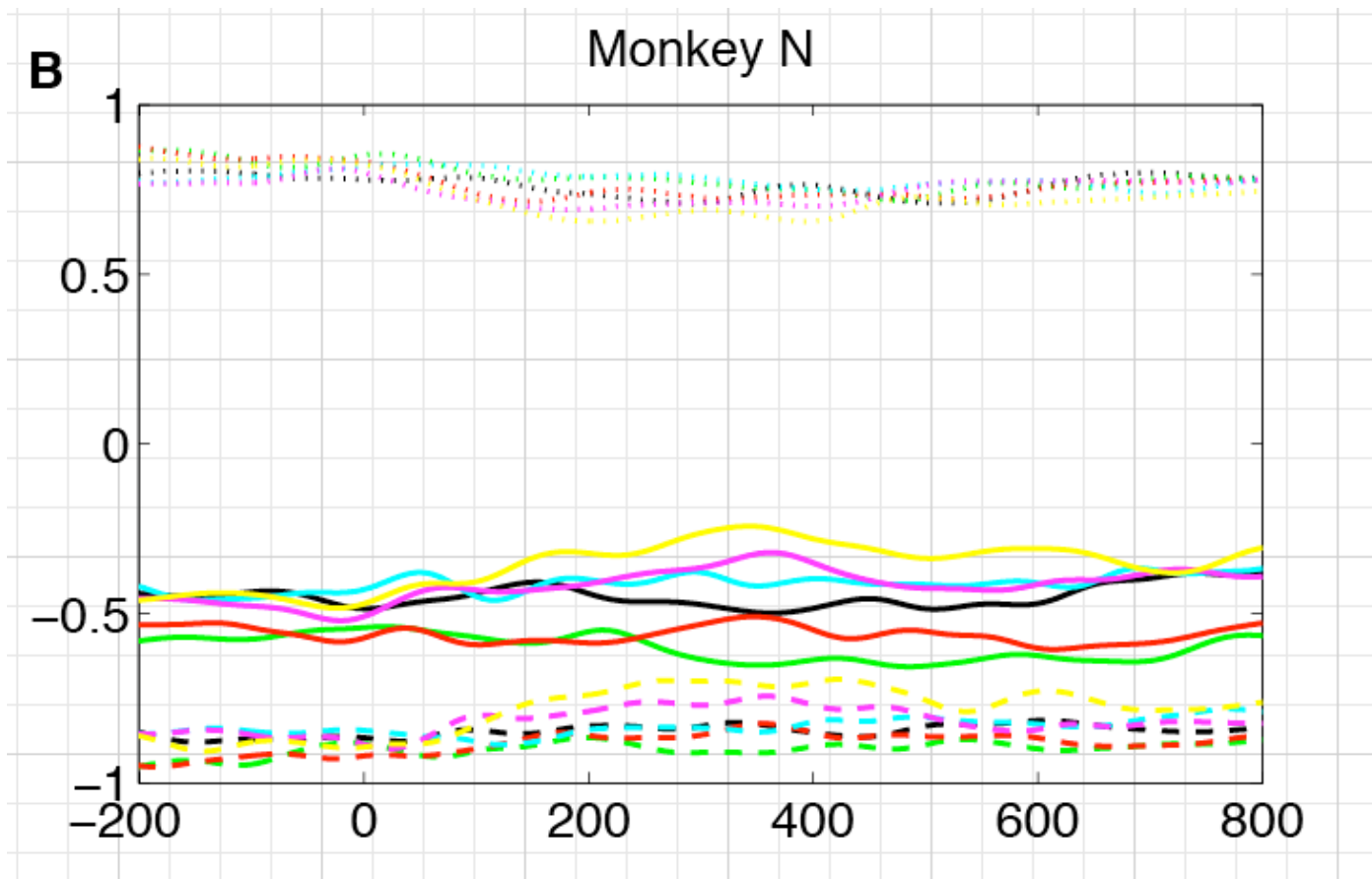
Roitman, Shadlen 02

# Again One Dimensional Dynamics!





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## Summary

Start: Arcane observation: every neuron has a common crossing time; equals attentional switching time

Theory: Activity in LIP in each local region operates along its own one dimensional slow mode.

Robustness of attentional switching time scale is a free lunch.

Prediction Verified: All the action in both attention and decision making occurs along the spontaneous activity.

