

# Activity-silent working memory

Seán Froudist-Walsh

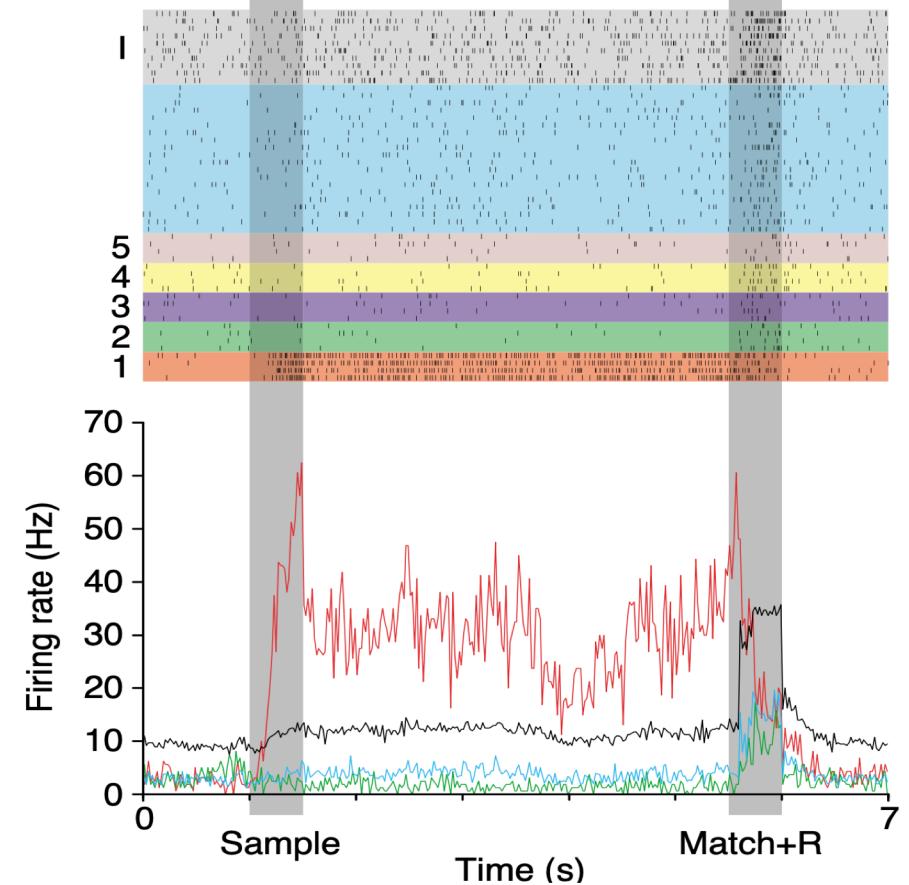
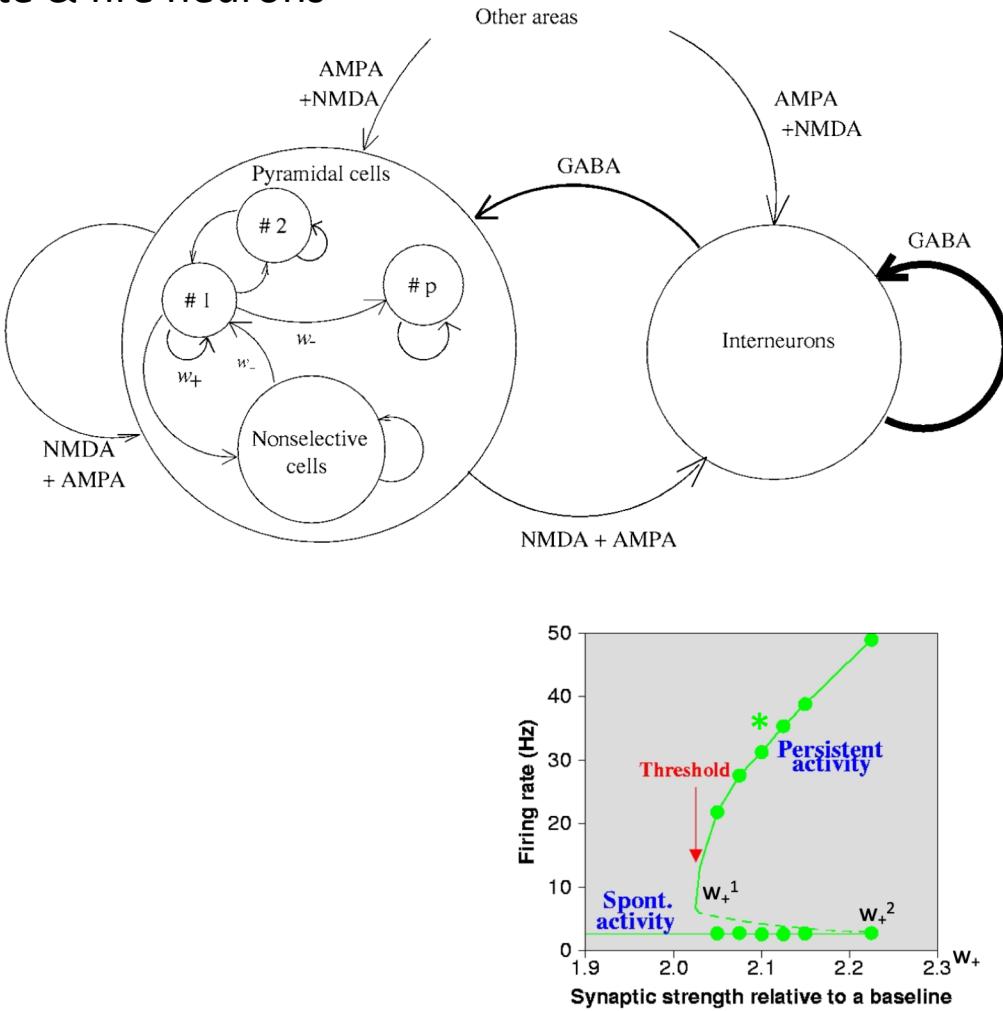
Lecturer in Computational Neuroscience

Recap – what is working memory?

Recap – how does the brain store information in working memory?

# Recap: A spiking neural network model of working memory in prefrontal cortex

Linear integrate & fire neurons



Brunel & Wang, 2001

# Fight!

## Persistent Spiking Activity Underlies Working Memory

Christos Constantinidis,<sup>1</sup> Shintaro Funahashi,<sup>2,3</sup> Daeyeol Lee,<sup>4,5,6,7</sup> John D. Murray,<sup>5</sup> Xue-Lian Qi,<sup>1</sup> Min Wang,<sup>4</sup> and Amy F.T. Arnsten<sup>4</sup>

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## Working Memory: Delay Activity, Yes! Persistent Activity? Maybe Not

Mikael Lundqvist,<sup>1</sup> Paweł Herman,<sup>2</sup> and Earl K. Miller<sup>1</sup>

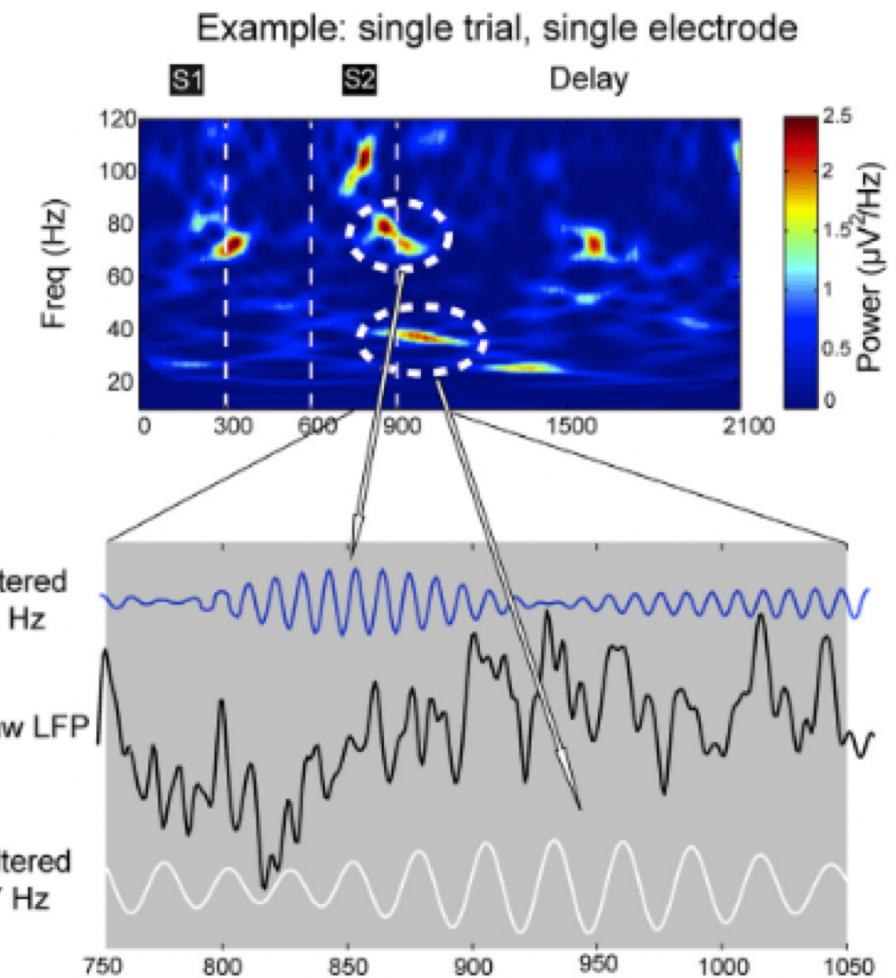
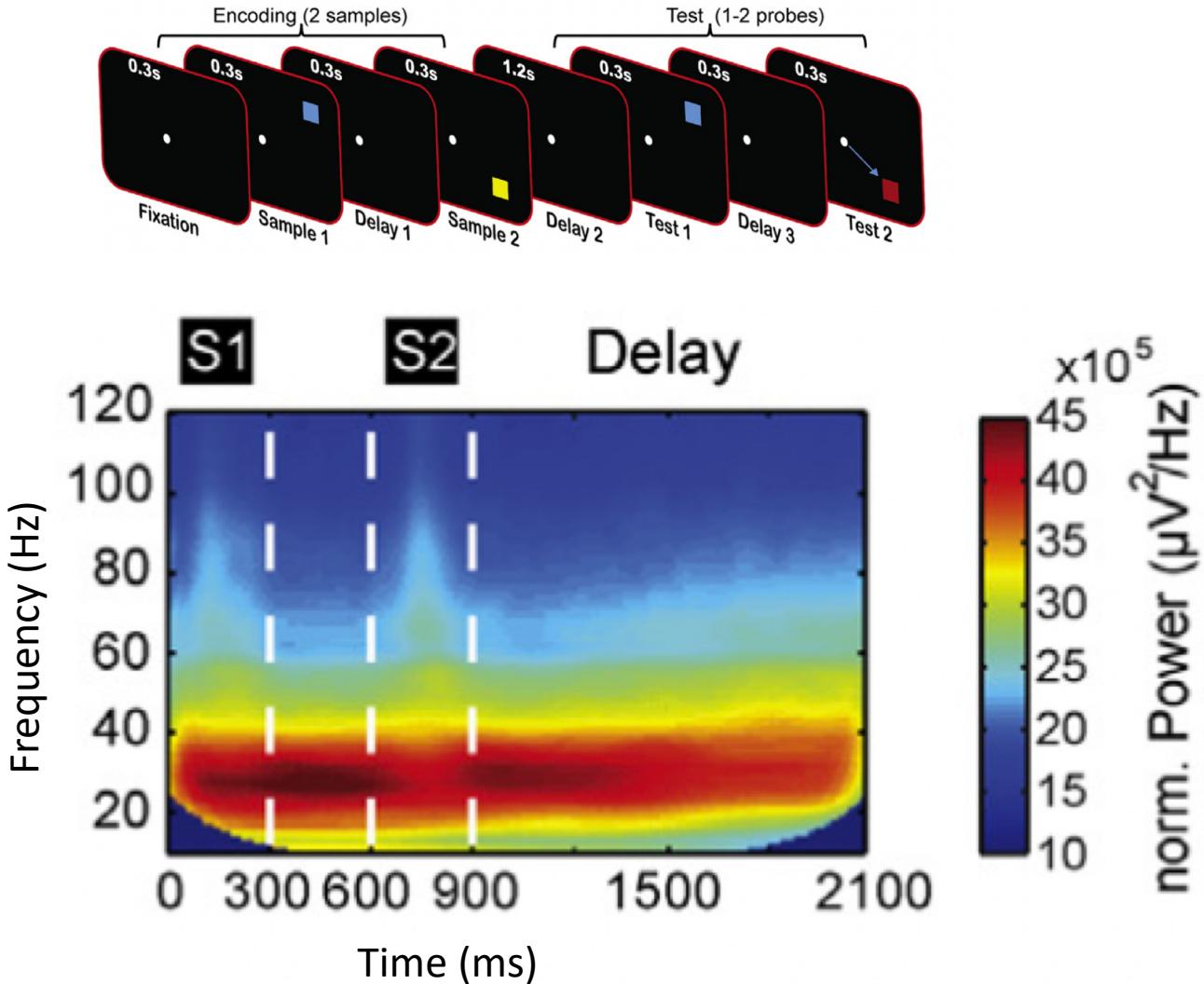
<sup>1</sup>Picower Institute for Learning & Memory and Department of Brain & Cognitive Sciences, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139 and <sup>2</sup>Computational Brain Science Laboratory, Department Computational Science & Technology, KTH Royal Institute of Technology, Stockholm, Sweden 11428

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# Learning objectives

- To understand the concept of 'activity-silent' working memory
- To study a neural network model of 'activity-silent' working memory
- To understand potential limitations of activity-silent mechanisms for working memory

# Working memory activity, not always stable and persistent?



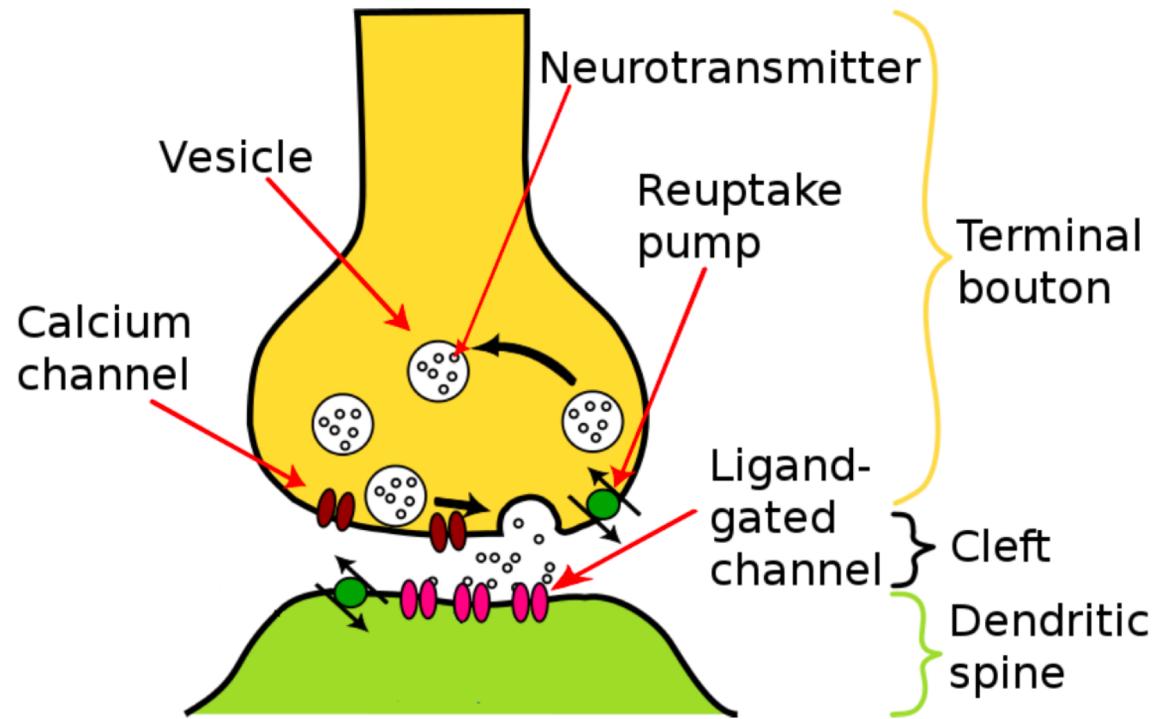
Lundqvist et al., *Neuron*, 2016

# Activity-silent working memory (definition)

- *Activity-silent working memory* is
  - the ability to hold information in mind without sensory input over a period of seconds
  - with either
    - the absence of detectable stimulus-specific neural activity
    - or stimulus-specific neural activity that decays to baseline during the delay period.

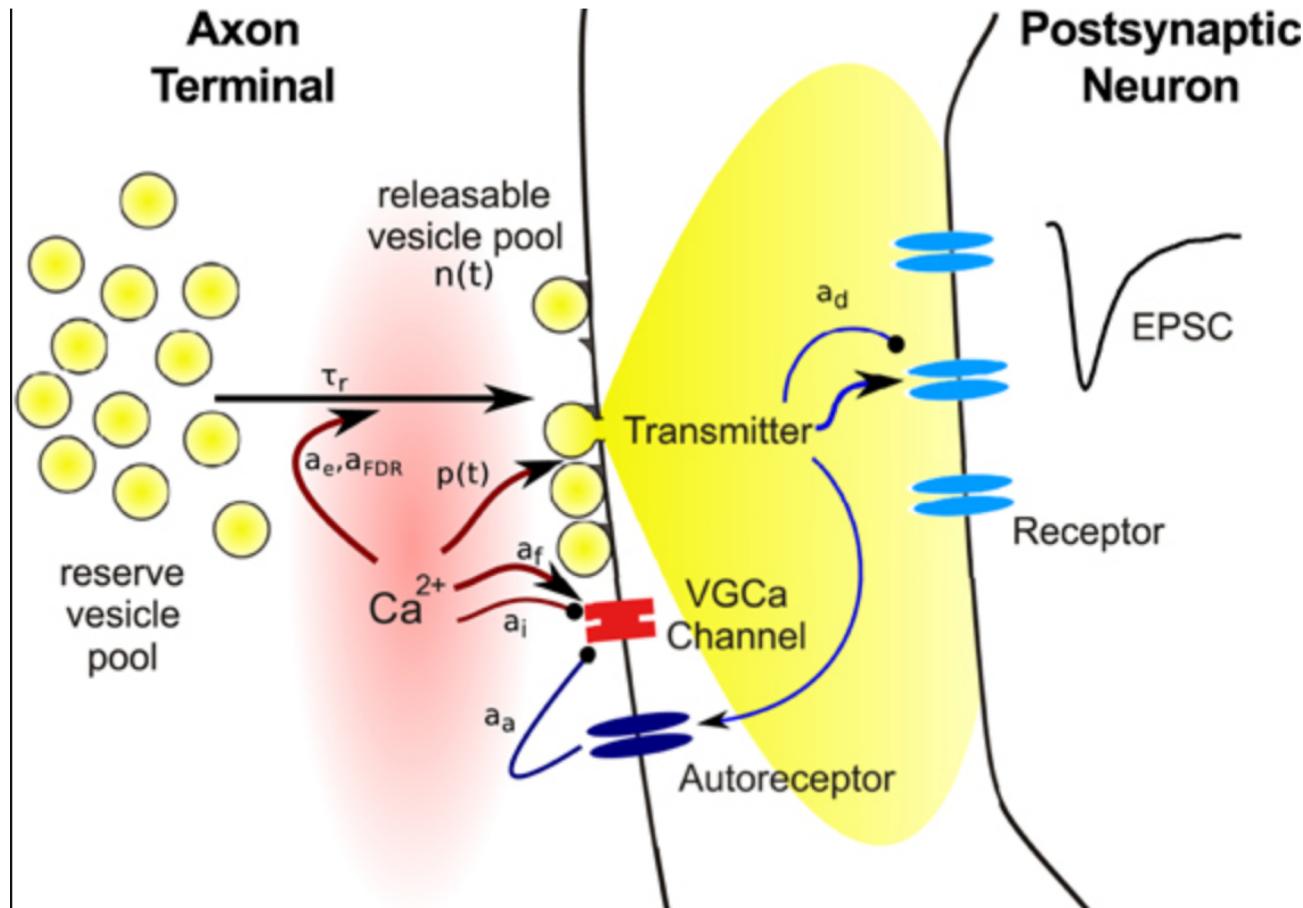
How could information be maintained in the short term without persistent activity?

# Recap: synapses



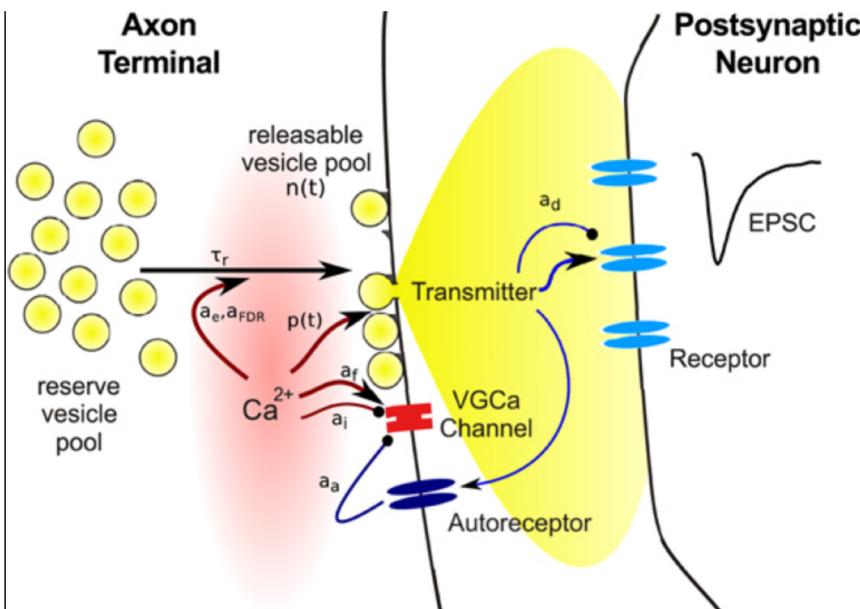
Conor Houghton notes

# Short-term synaptic plasticity



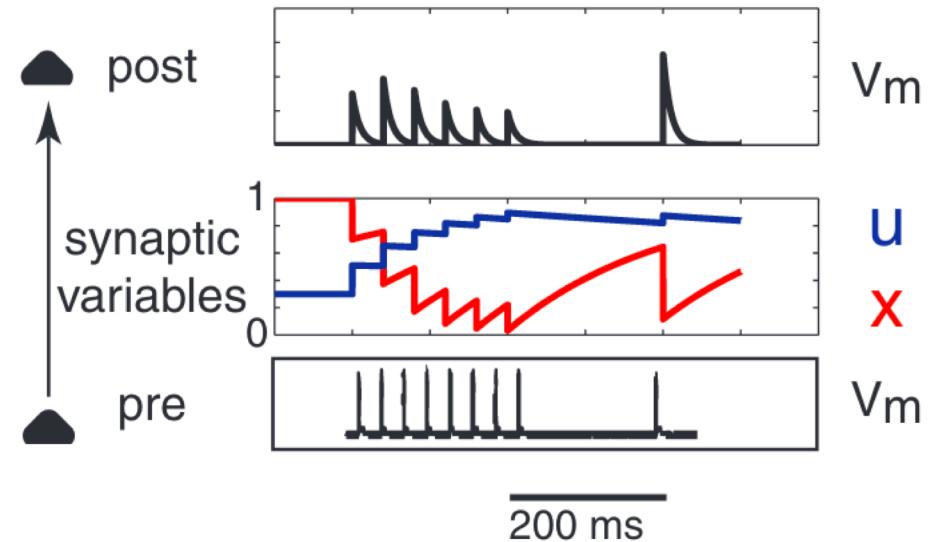
- **Facilitation**
  - increased current in post-synaptic response with repeated stimulation
  - left-over calcium from earlier spikes increases the probability of vesicle fusing to membrane & releasing neurotransmitter
- **Depression**
  - decreased current in post-synaptic response with repeated stimulation
  - vesicles in releasable pool have not yet replenished by time of new spike

# Simulating short-term plasticity



$$\frac{dx}{dt} = \frac{1 - x}{\tau_D} - u \ x \ \delta(t-t_{sp})$$

$$\frac{du}{dt} = \frac{U - u}{\tau_F} + U (1 - u) \ \delta(t-t_{sp})$$



Temporary synaptic strength from neuron j to neuron i =  $w_{ij}^{EE} x_j u_j$

baseline synaptic strength x depletion of vesicles x increase in calcium

$$\tau_D = 200 \text{ ms}, \tau_F = 1500 \text{ ms}$$

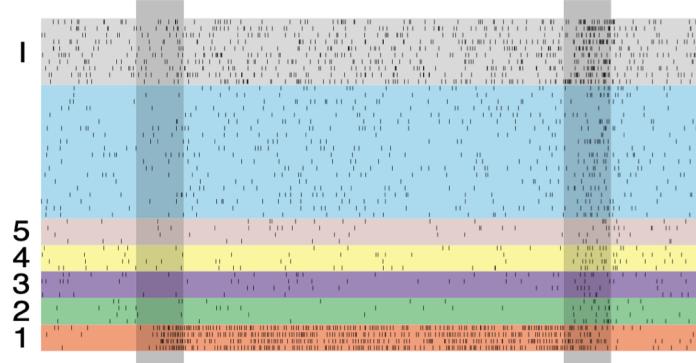
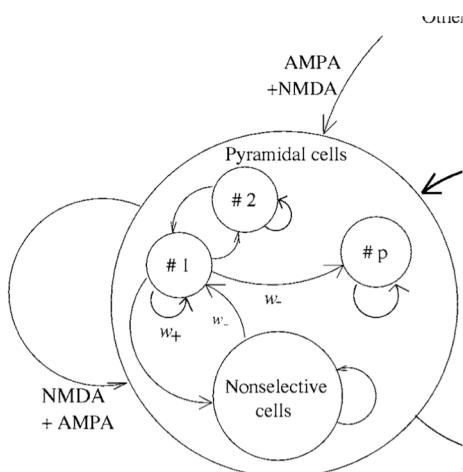
depression facilitation

Mongillo, Barak & Tsodyks, *Science*, 2008

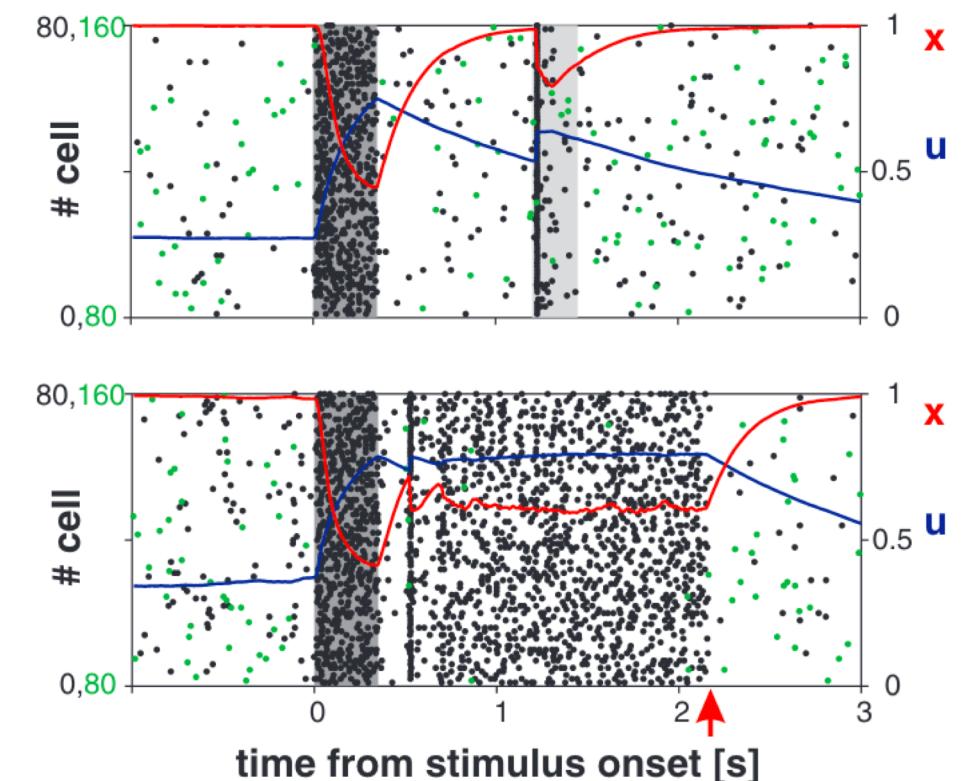
# Short-term plasticity as a mechanism for activity-silent working memory

$$\frac{dx}{dt} = \frac{1-x}{\tau_D} - u \ x \ \delta(t-t_{sp})$$

$$\frac{du}{dt} = \frac{U-u}{\tau_F} + U (1-u) \delta(t-t_{sp})$$

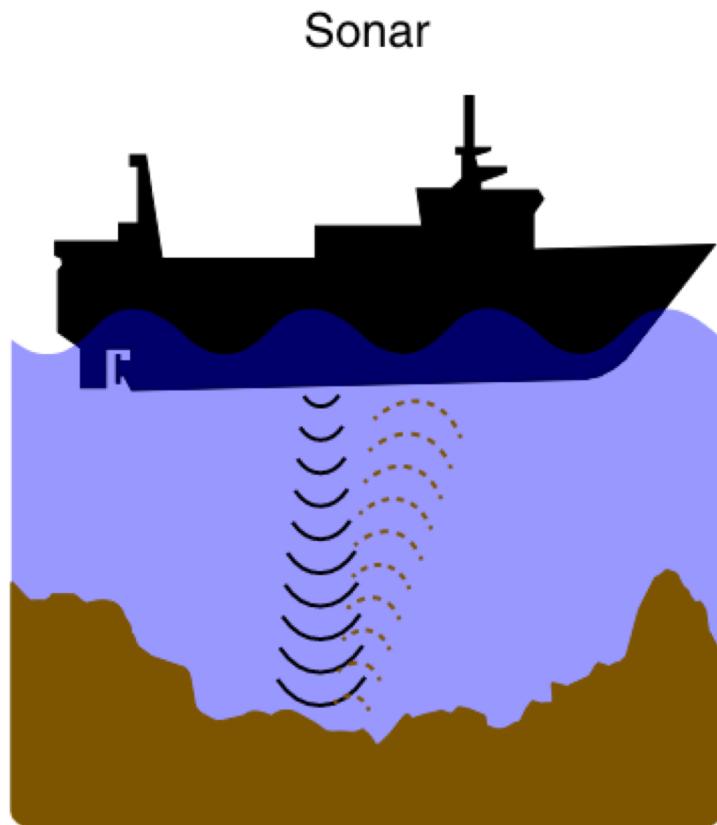


Brunel & Wang, *J. Comp. Neurosci.*, 2001

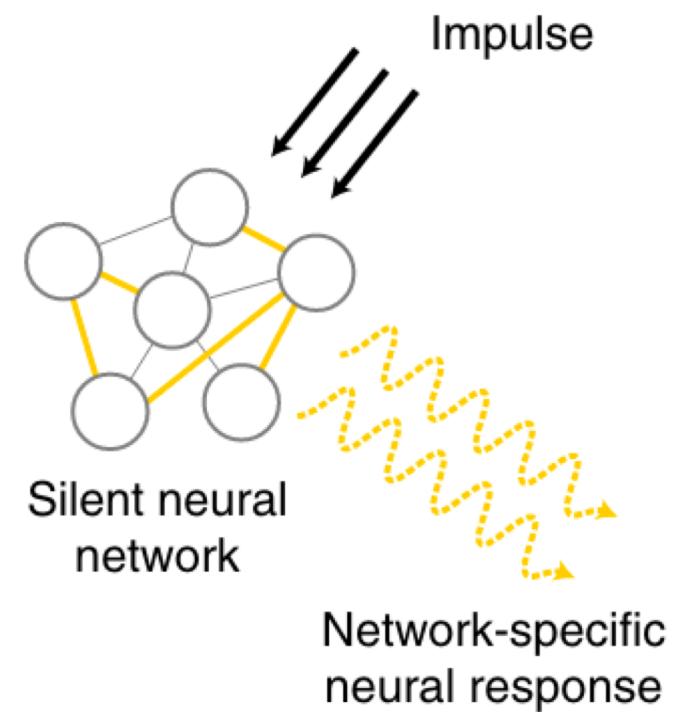


Mongillo, Barak & Tsodyks, *Science*, 2008

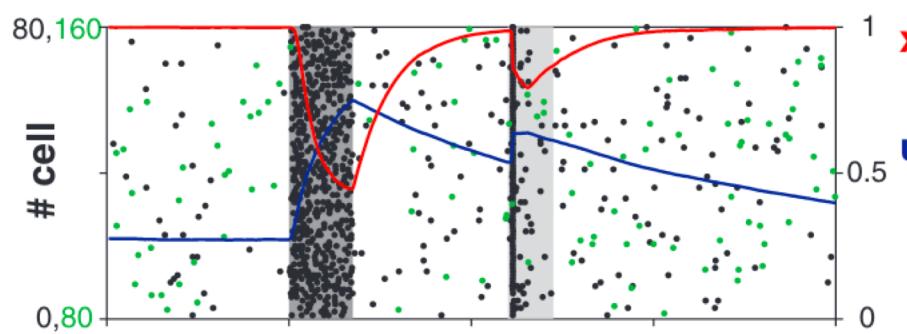
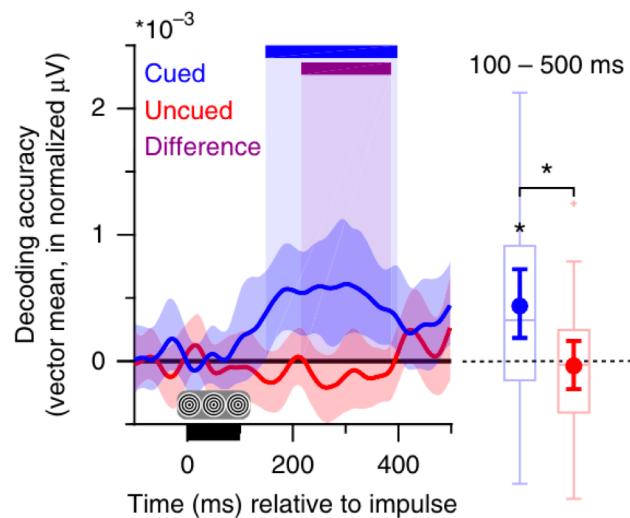
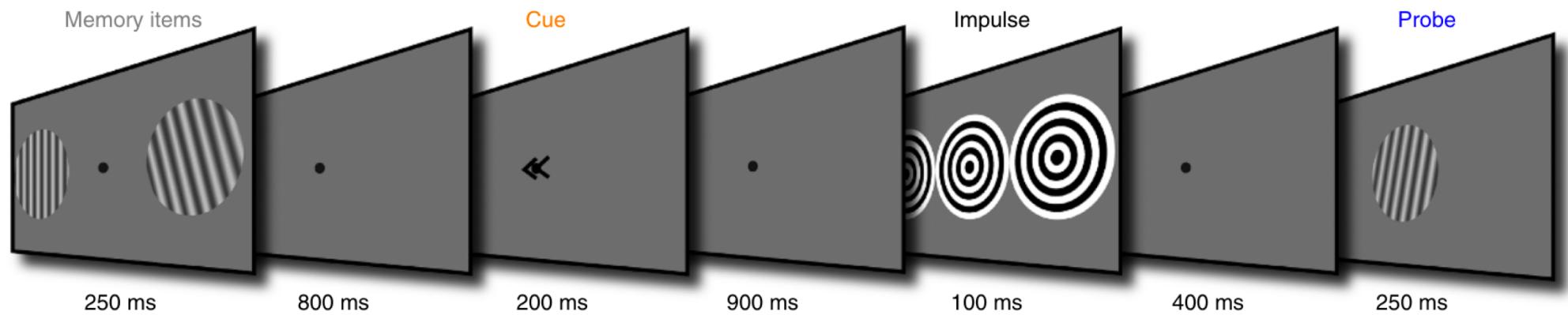
# How can we detect ‘silent’ changes?



Pinging the brain



# Pinging the brain to reveal signatures of ‘activity silent’ working memory in the brain

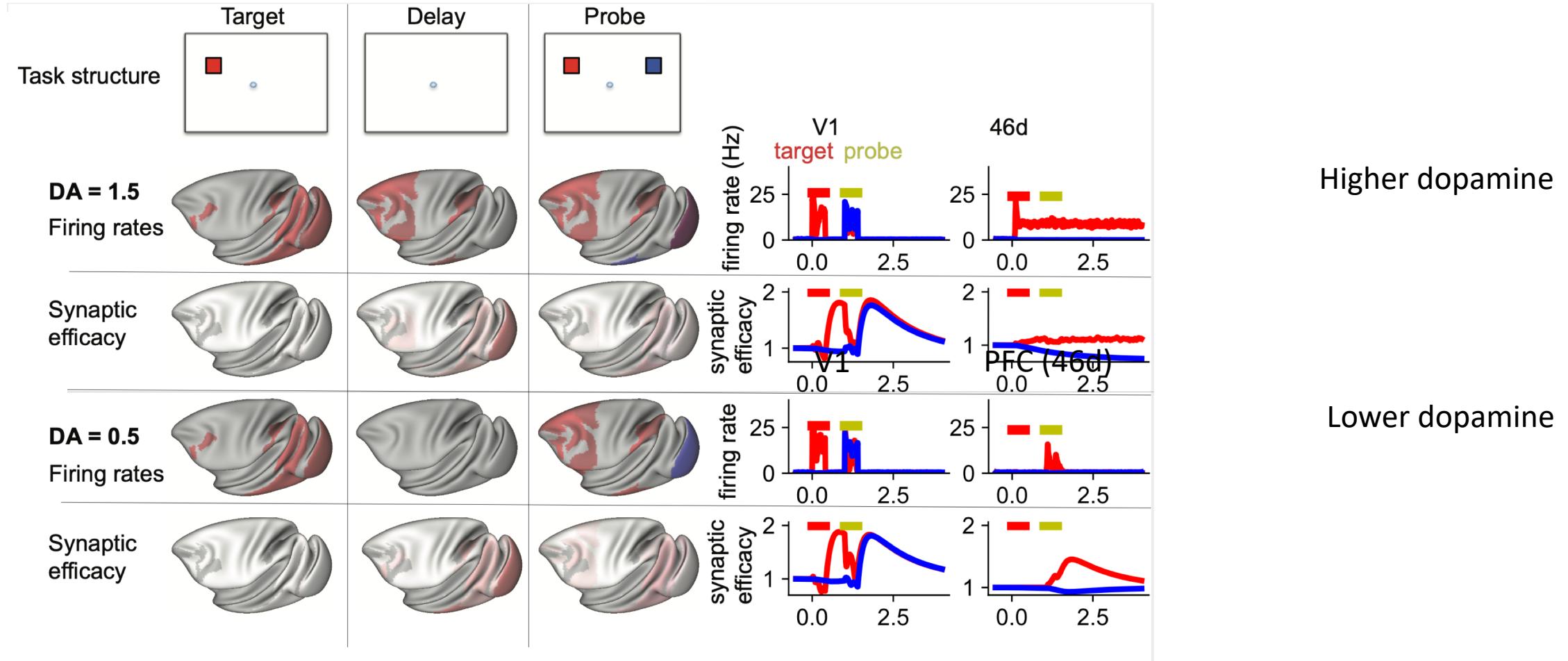


Mongillo, Barak & Tsodyks, *Science*, 2008

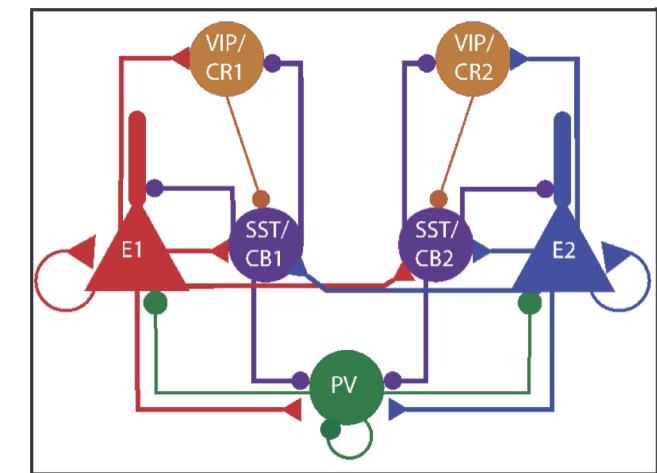
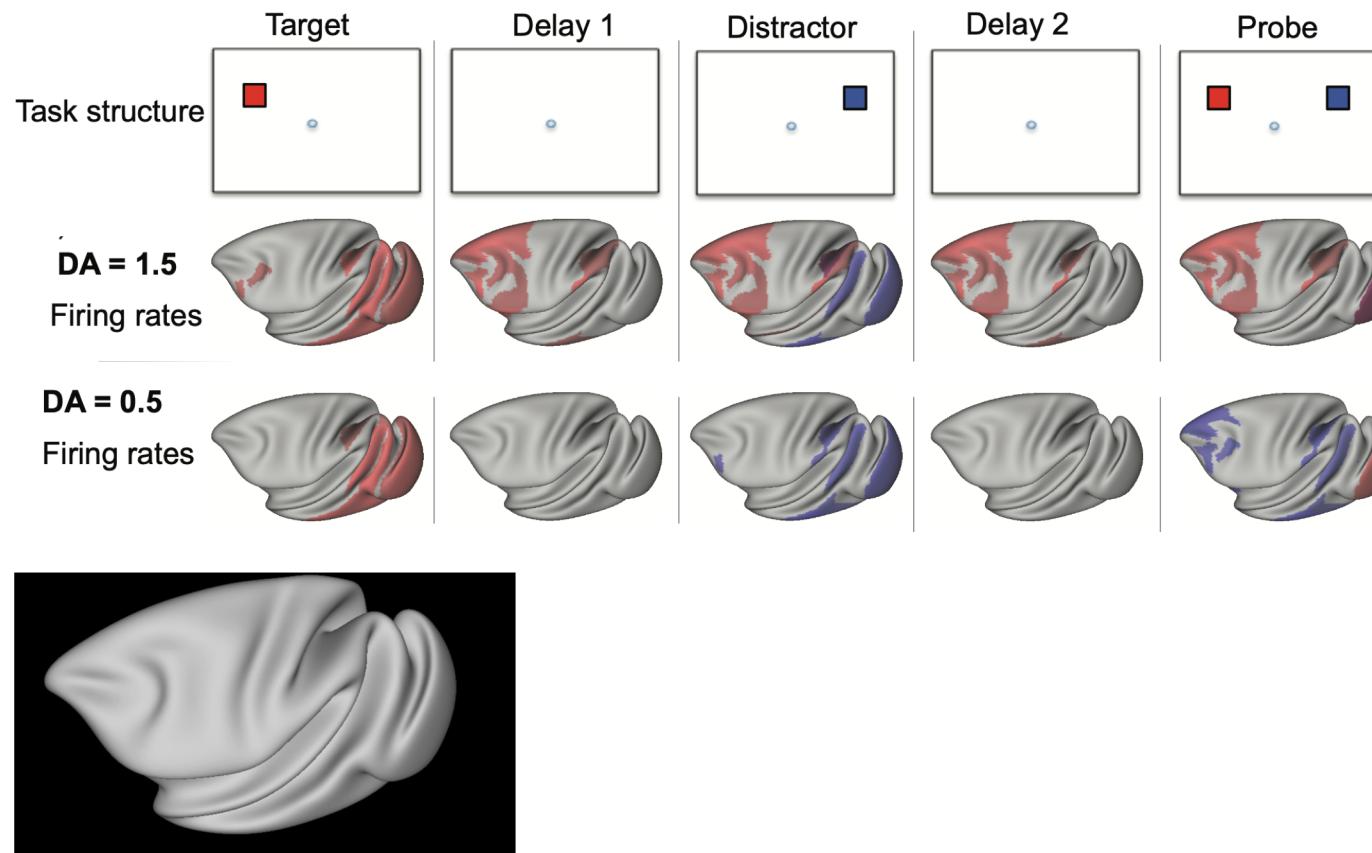
Wolff et al., *Nat. Neurosci*, 2017  
see also:

Rose et al., *Science*, 2016

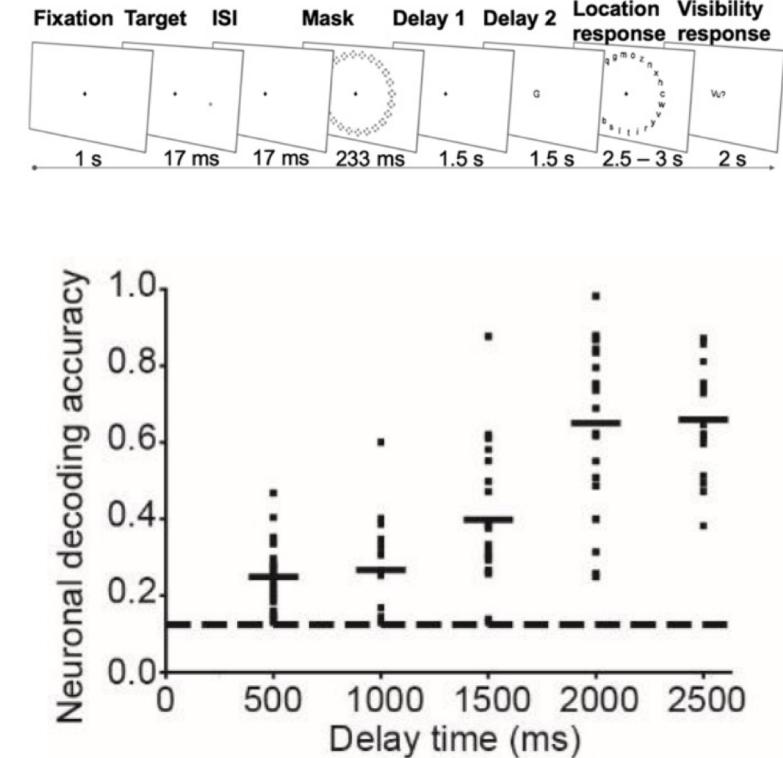
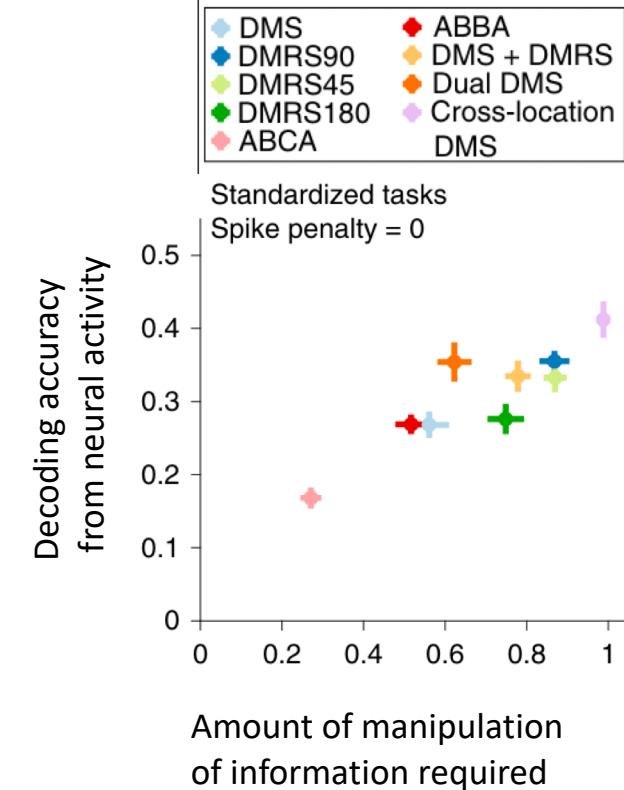
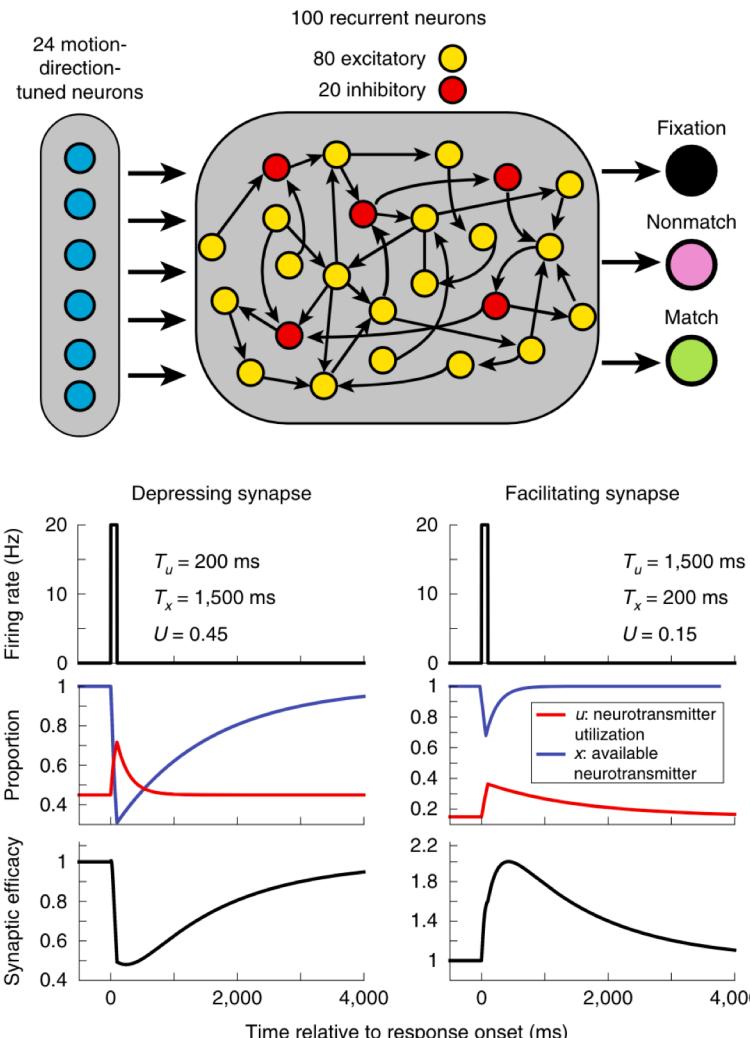
# Switching from the activity-silent state to persistent firing by releasing dopamine



# 'Activity-silent' working memory is vulnerable to distraction



# Training networks to solve tasks using activity-silent or persistent activity mechanisms



Greater reliance on neural activity when working memory tasks

- have a longer delay
- require manipulation of information stored in working memory

# Reviewing learning objectives

- To understand the concept of 'activity-silent' working memory
  - Some studies do not detect persistent activity throughout the delay, so there may be 'activity-silent' mechanisms to store information in the short-term
- To study a neural network model of 'activity-silent' working memory
  - Mongillo, Barak & Tsodyks' model based on short-term synaptic plasticity
- To understand potential limitations of activity-silent mechanisms for working memory
  - Vulnerable to distractors
  - limited time
  - not suitable for manipulating information

# Thank you!

- Contact me on Teams!