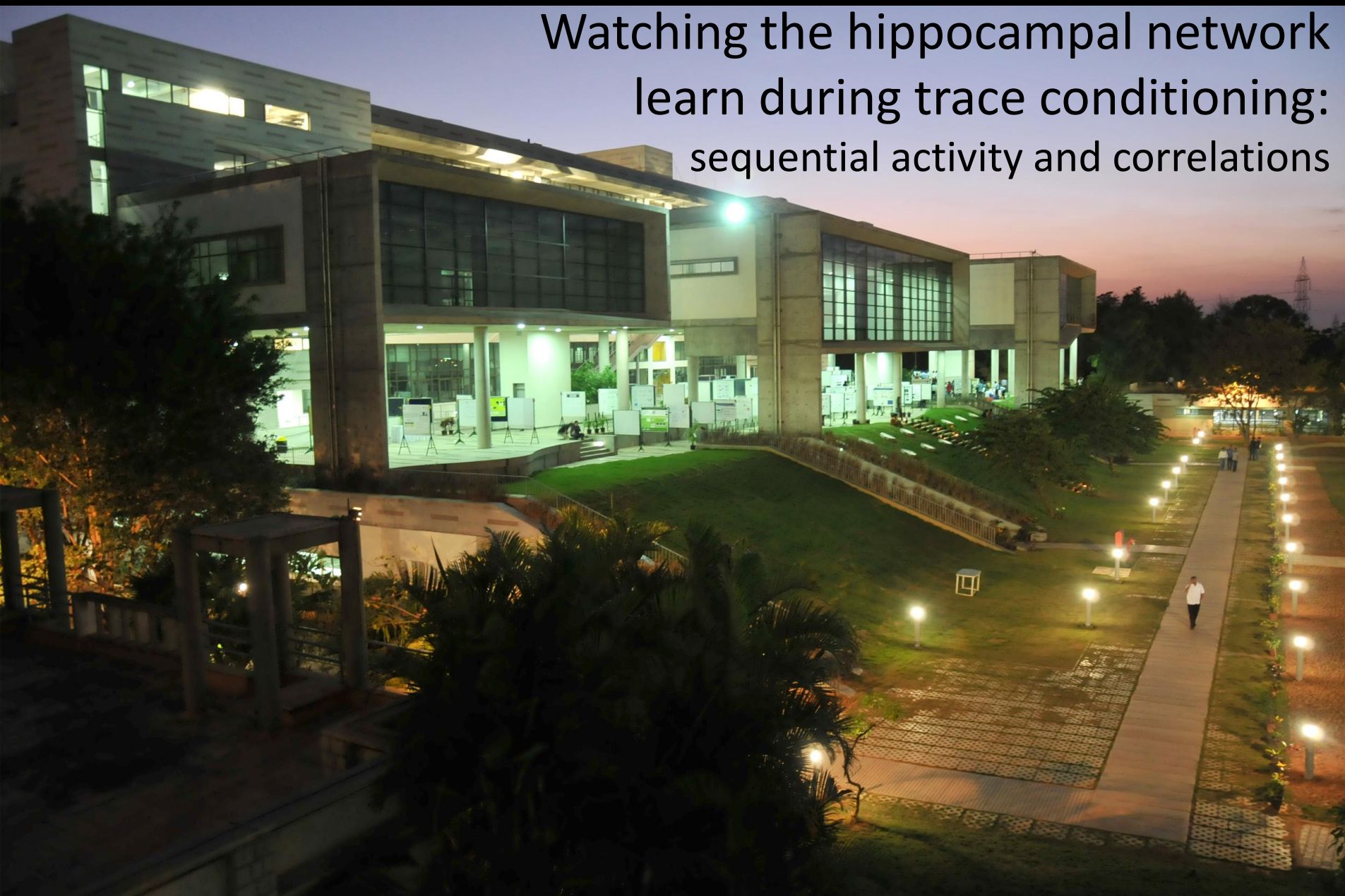


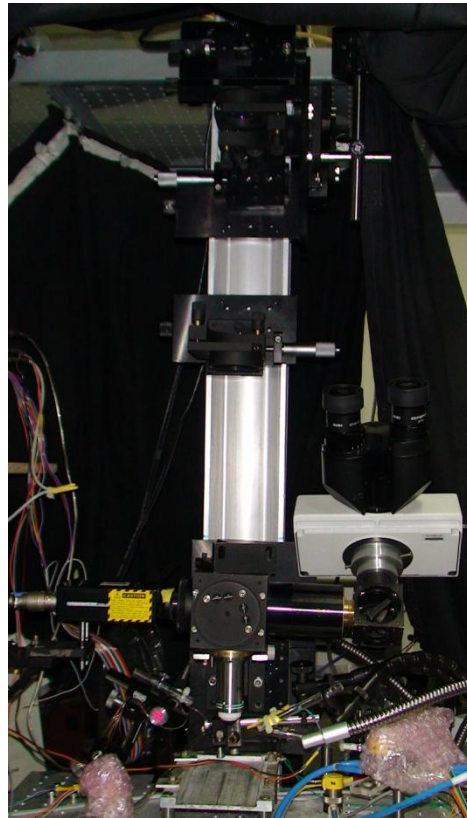
Watching the hippocampal network
learn during trace conditioning:
sequential activity and correlations



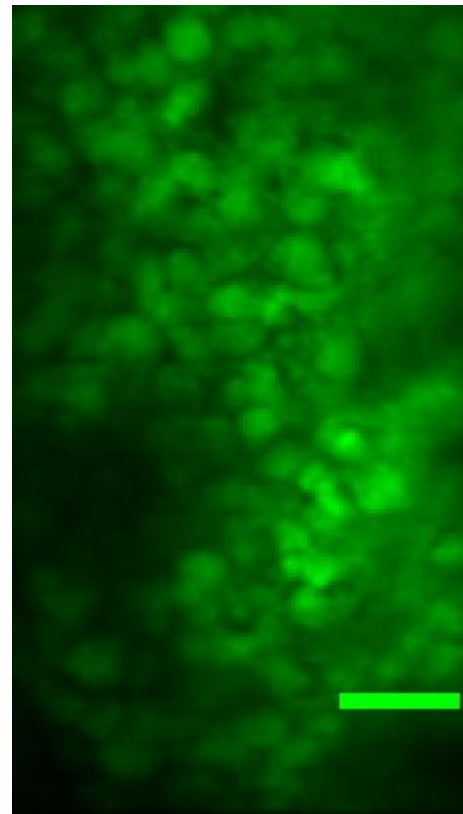
People and systems



Mehrab N. Modi



Bheja Fry



Mouse brain



K. Ananthamurthy



Ashesh Dhawale



Aanchal Bhatia

The system

Behaviour

Systems

Areas

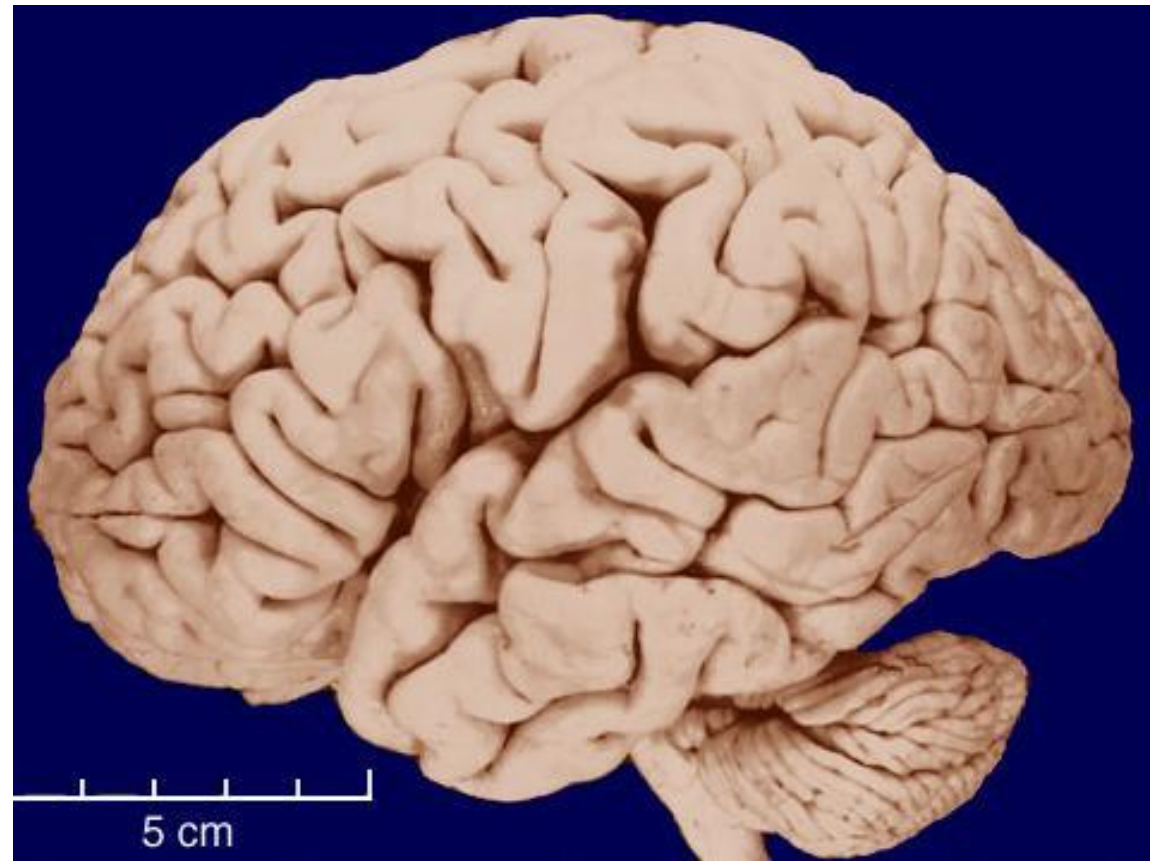
Circuits

Neurons

Dendrites

Synapses

Molecules



<http://www.brainmuseum.org/>

University of Wisconsin and Michigan State Comparative Mammalian Brain Collections; National Museum of Health and Medicine.

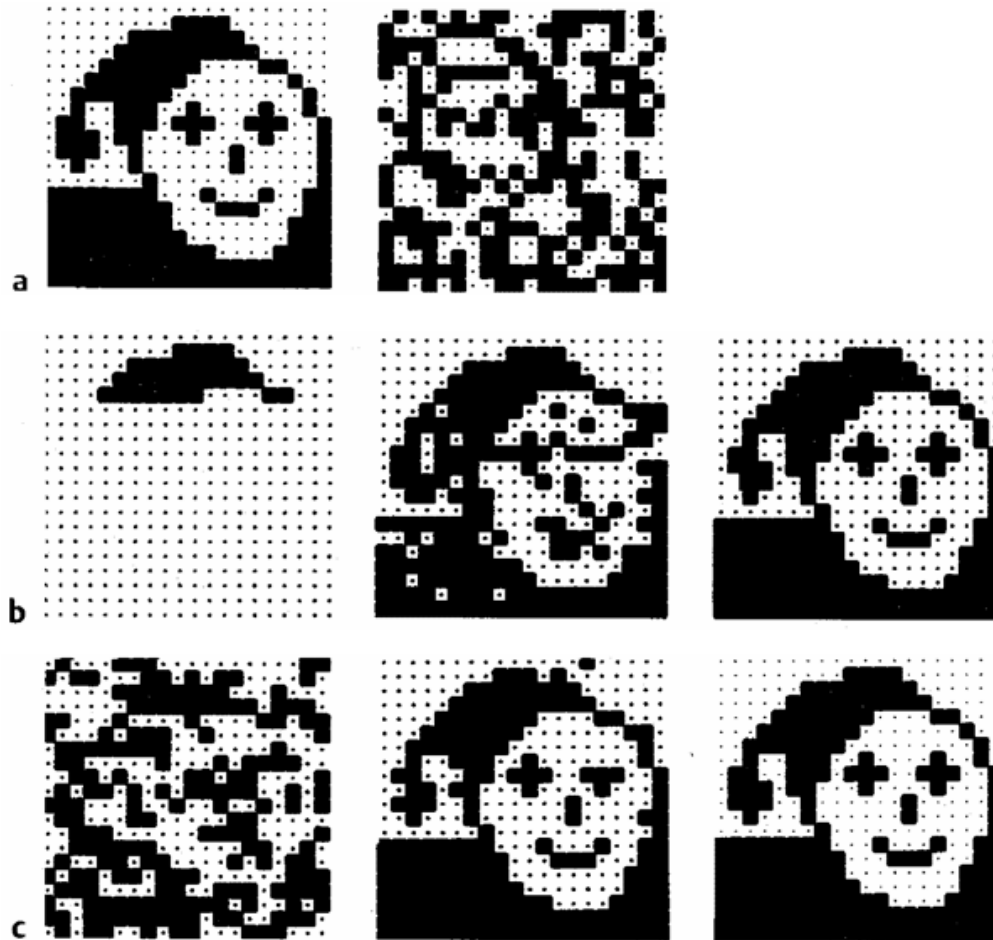
Questions on network learning

- What changes occur in activity?
- What changes occur in connectivity?
- What are the rules?
- How does multiscale signaling implement these rules?

Questions on network learning

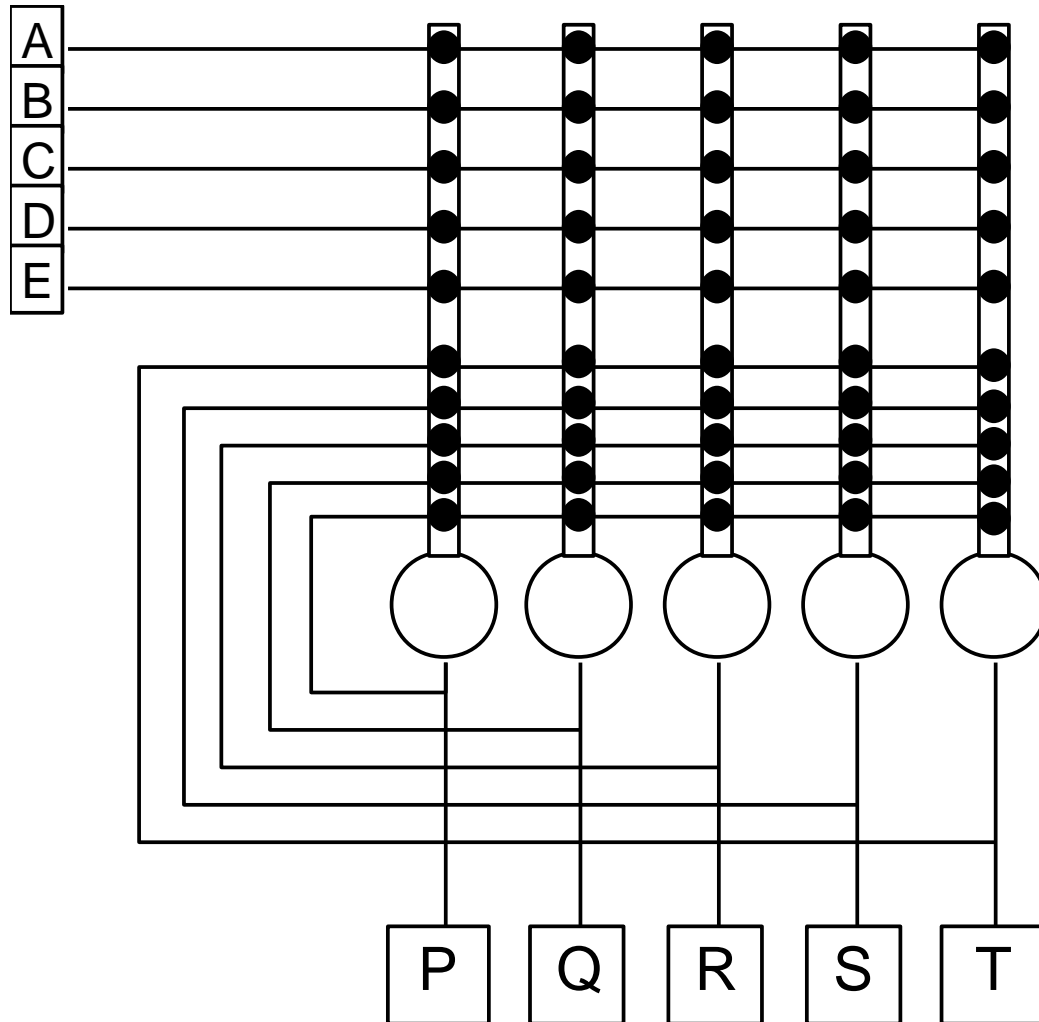
- What changes occur in activity?
- What changes occur in connectivity?
- What are the rules?
- How does multiscale signaling implement these rules?

Pattern recognition and completion

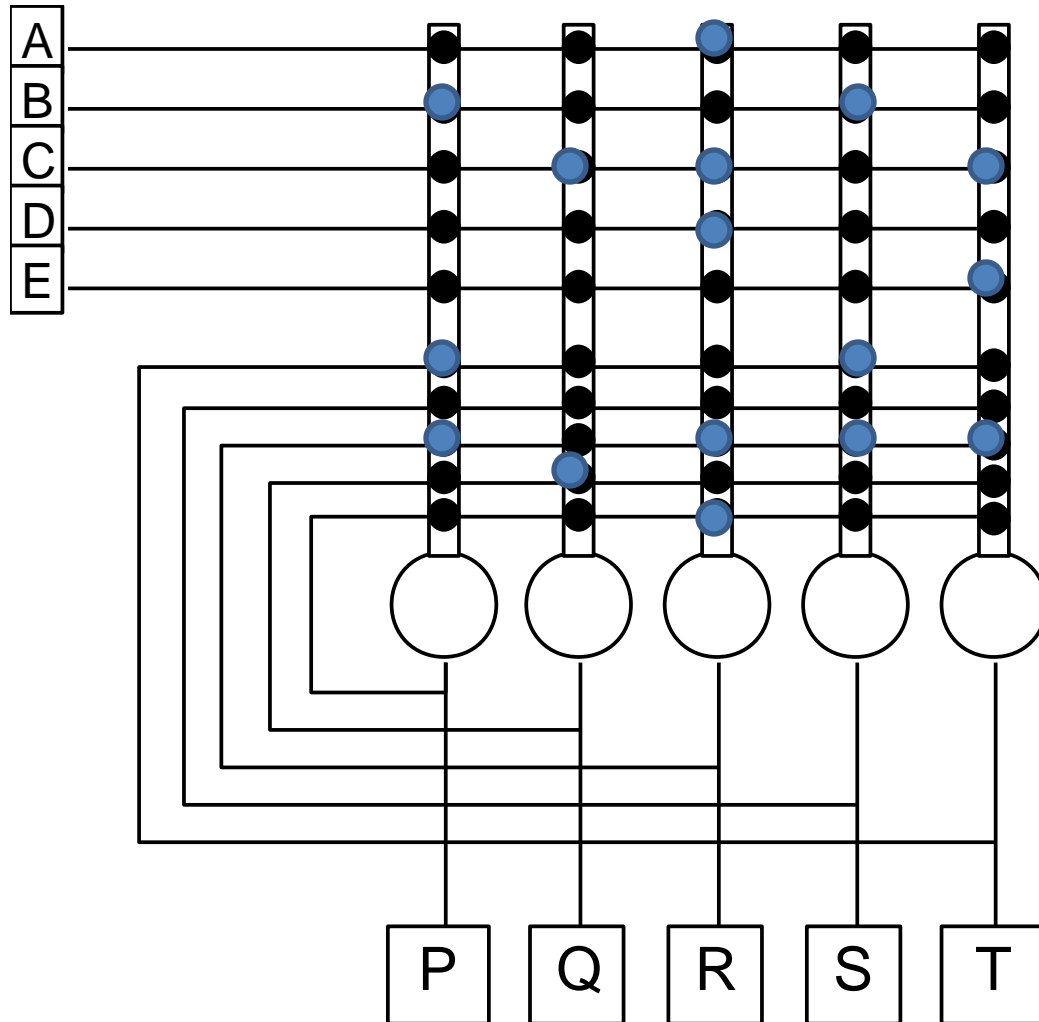


Neural Networks as Cybernetic Systems
Holk Cruse

Network models: Associative memory



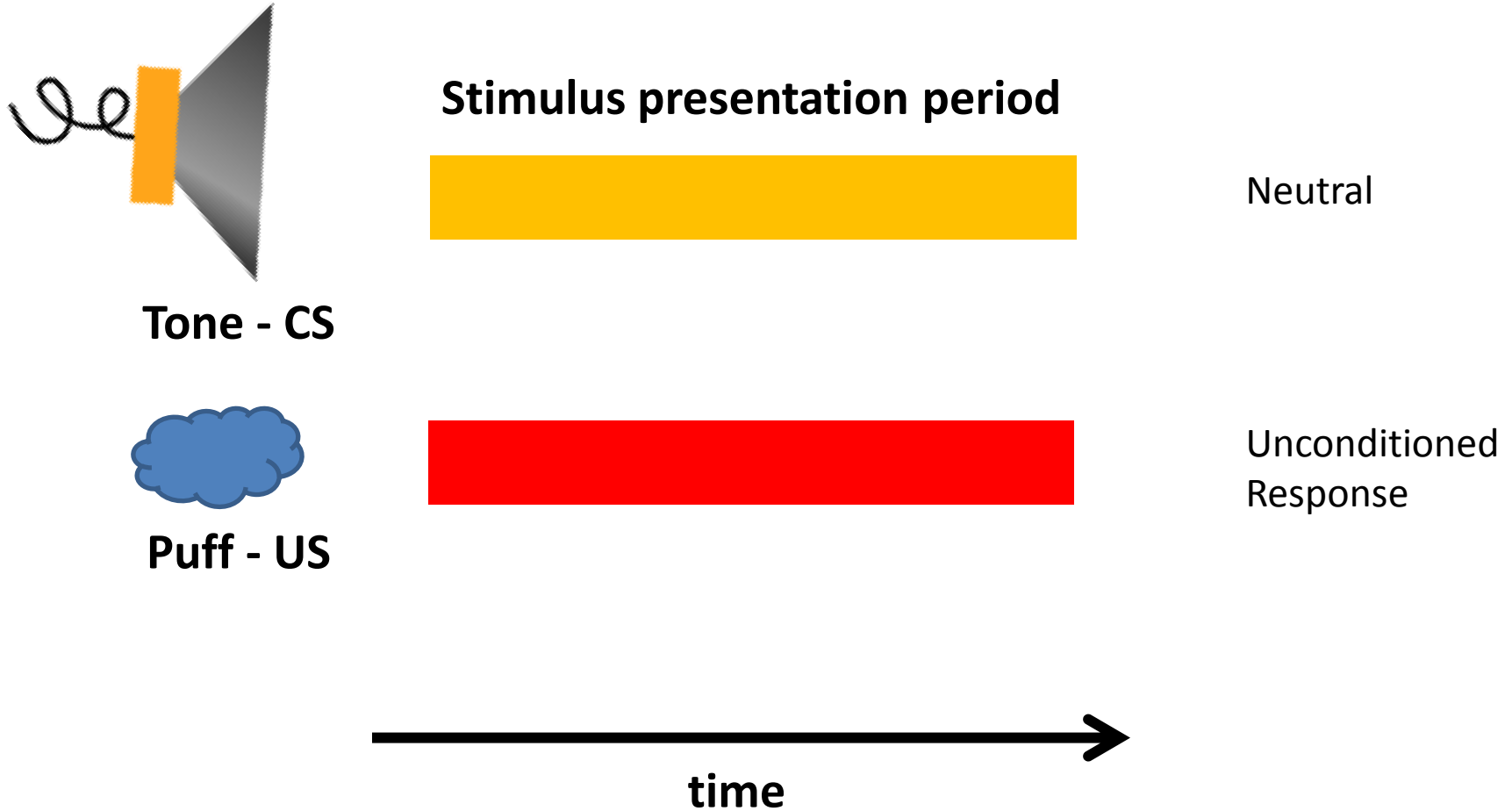
Synaptic weights define contents of this memory



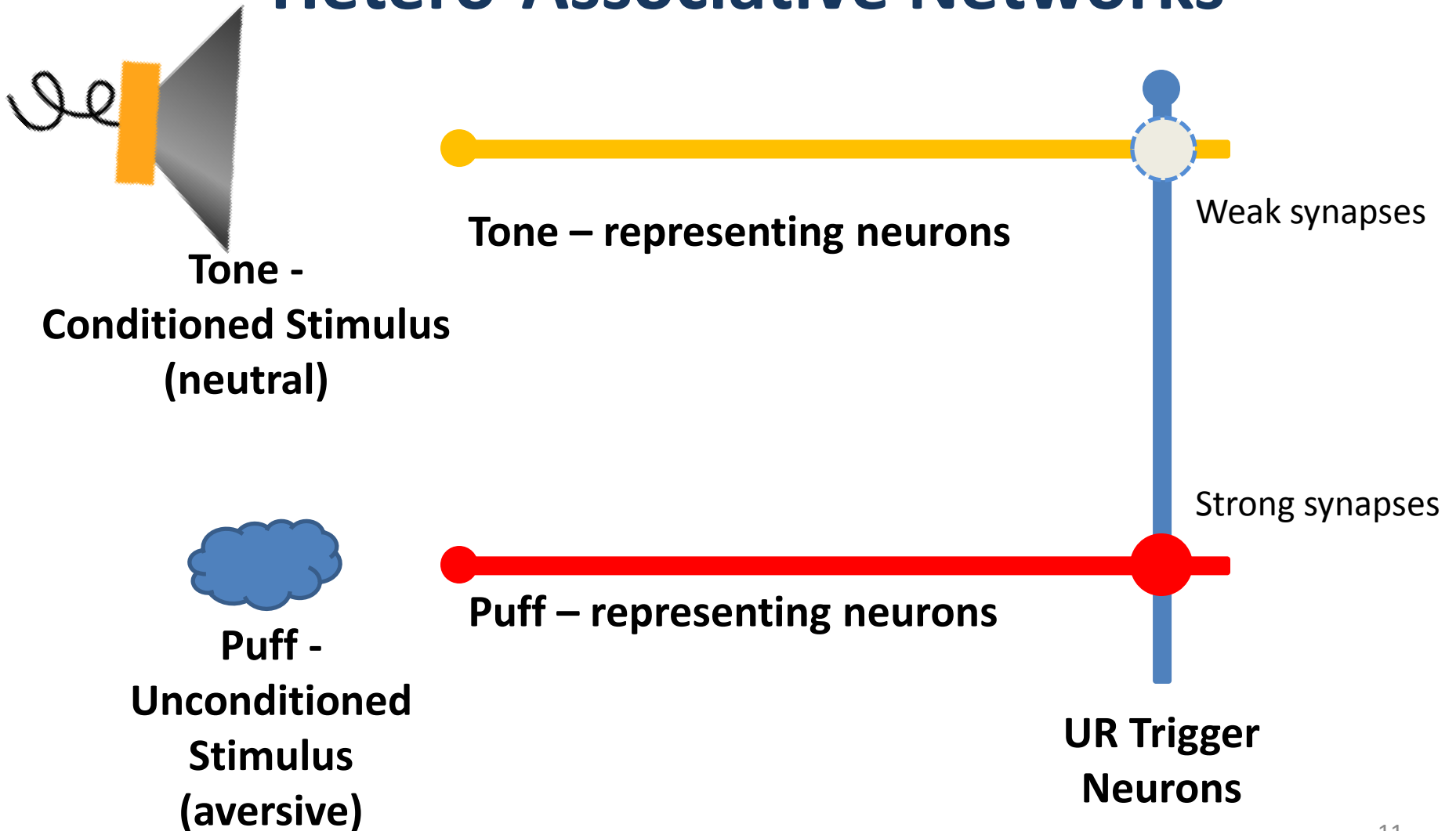
Questions on network learning

- What changes occur in activity?
 - Readout of what has been stored
- What changes occur in connectivity?
 - Synaptic weights as a network basis for storage
 - Note that excitability and other changes may occur too.
- What are the rules?
- How does multiscale signaling implement these rules?

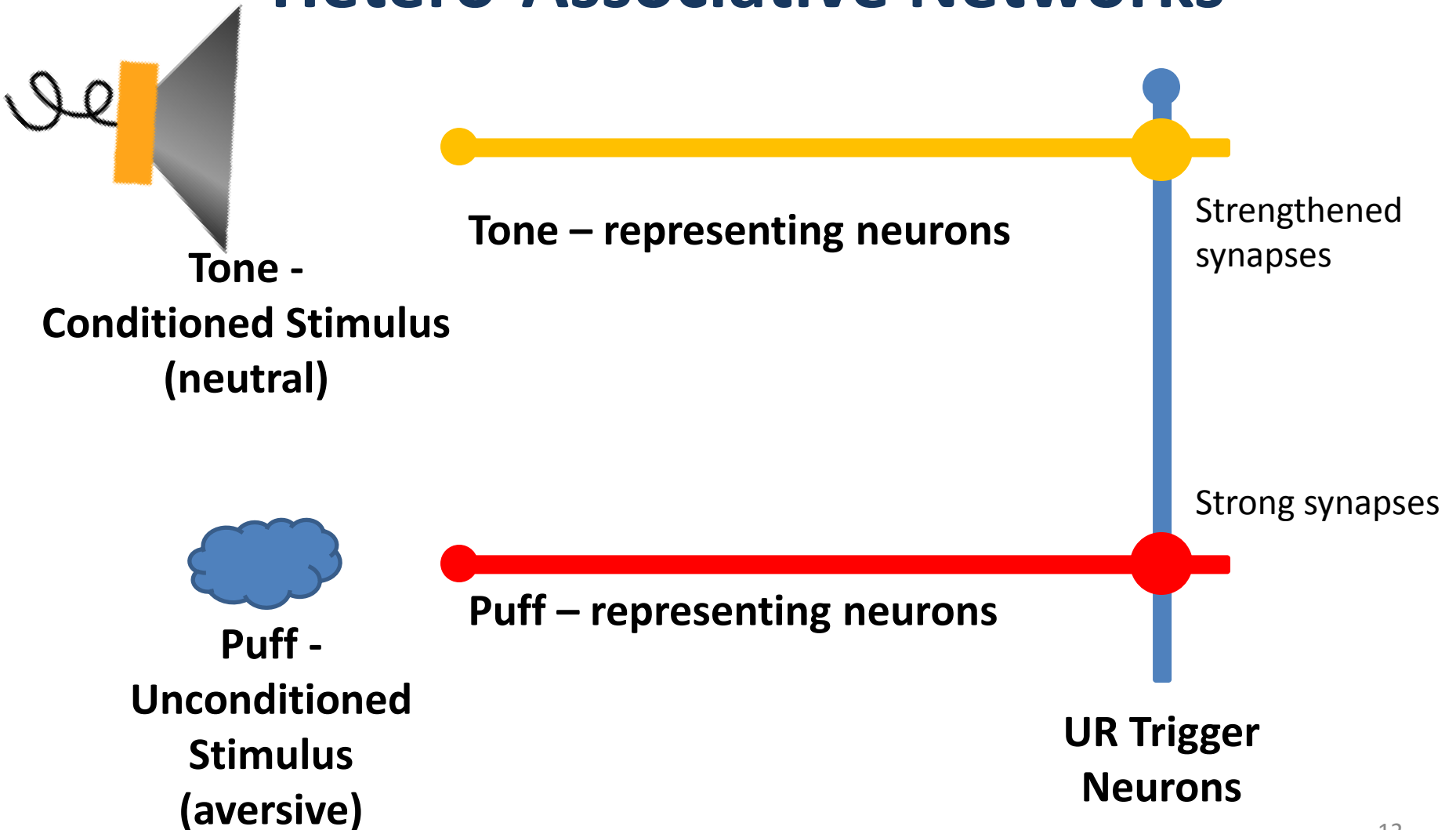
Classical Conditioning: an experimental model of memory



Hebbian Associations and Hetero-Associative Networks



Hebbian Associations and Hetero-Associative Networks



Hebbian Associations



Tone - CS



Puff - US

Stimuli co-presented



time

Hebbian Associations



Tone - CS



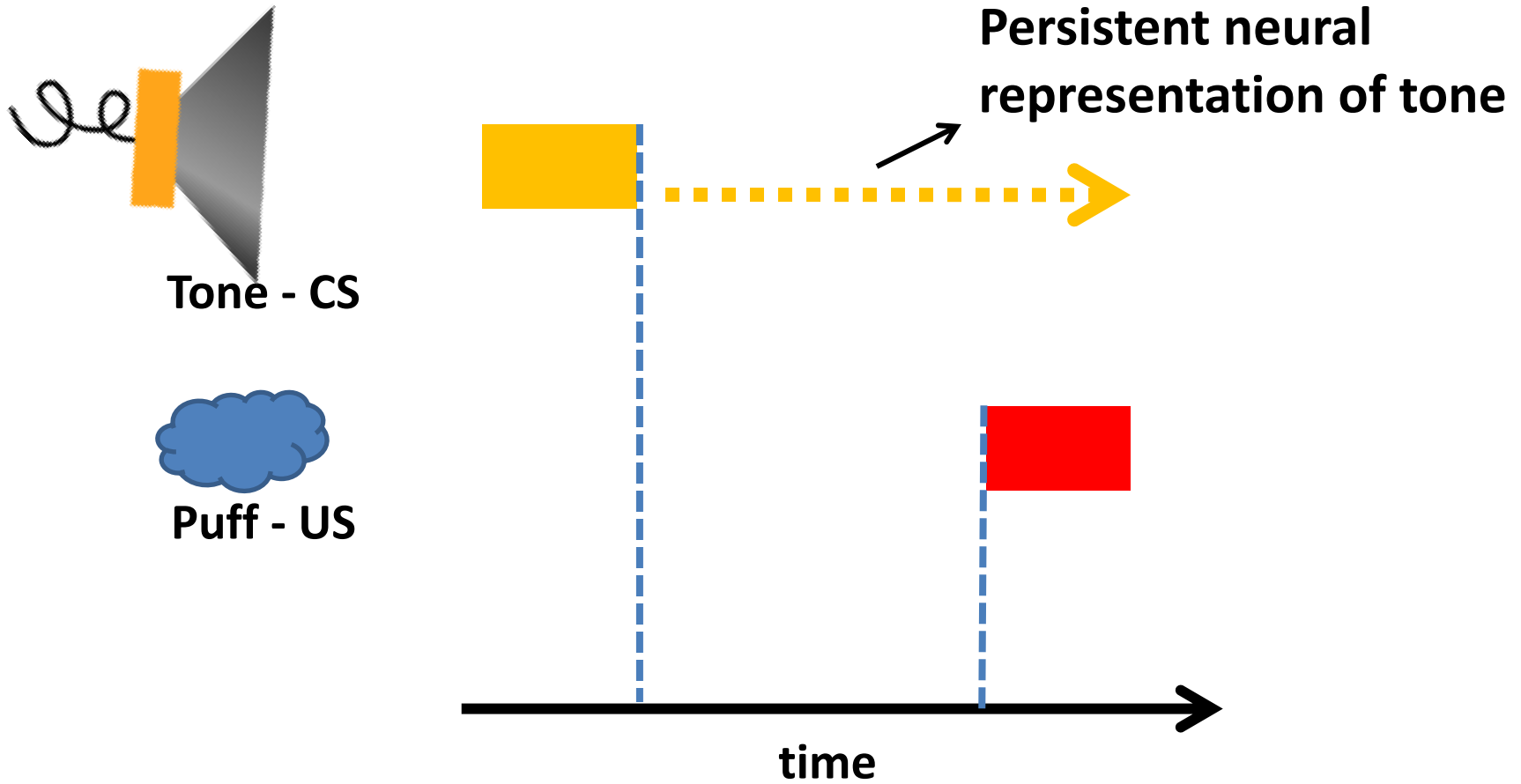
Puff - US

Separated stimuli - ?



time

Hebbian Associations



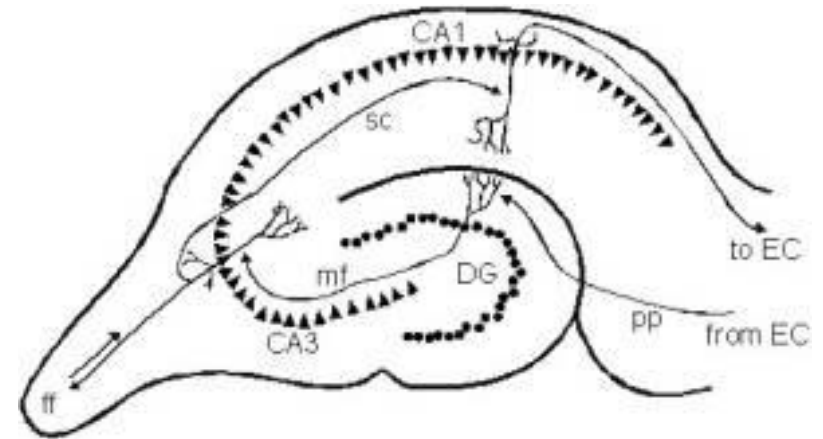
Functions, Circuit of the Mammalian Hippocampus

Mouse hippocampus: involved in memory formation, navigation

Multi-modal inputs to CA3 through DG

CA3 forms auto-associative network

CA3-CA1 network hetero-associative, feed-forward



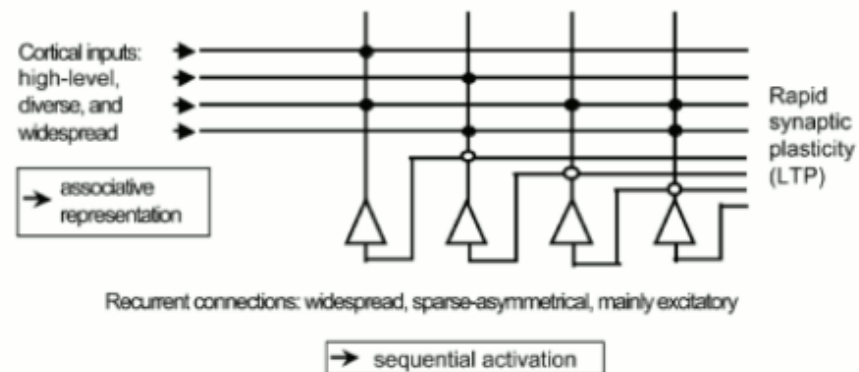
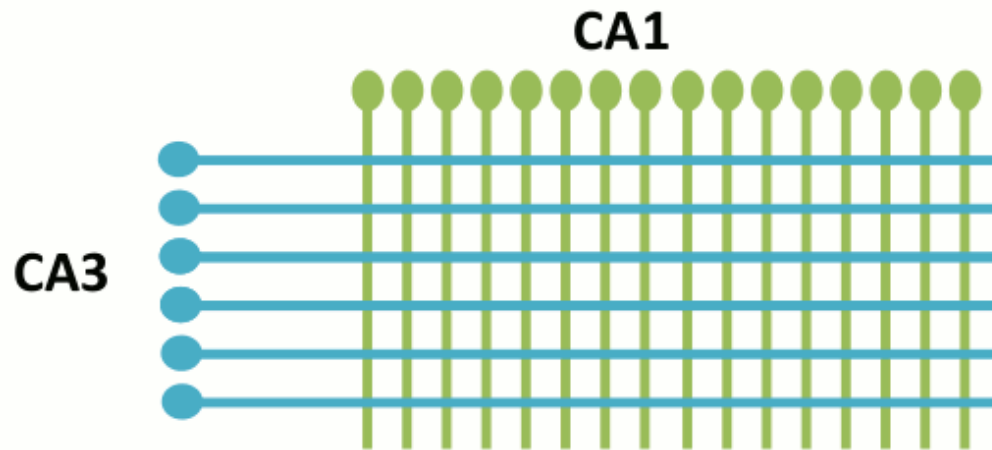
Hippocampal Circuit - Implications

Feed-forward CA3-CA1 connections

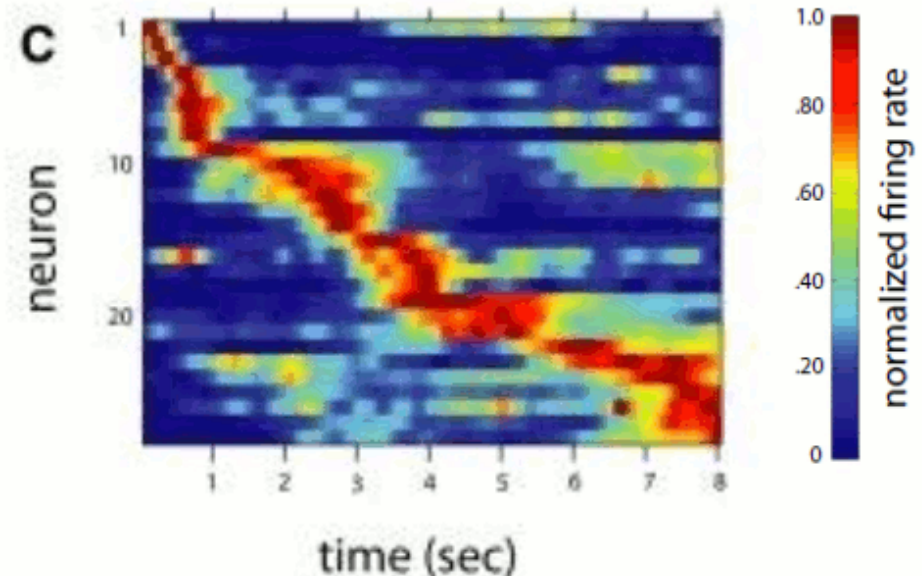
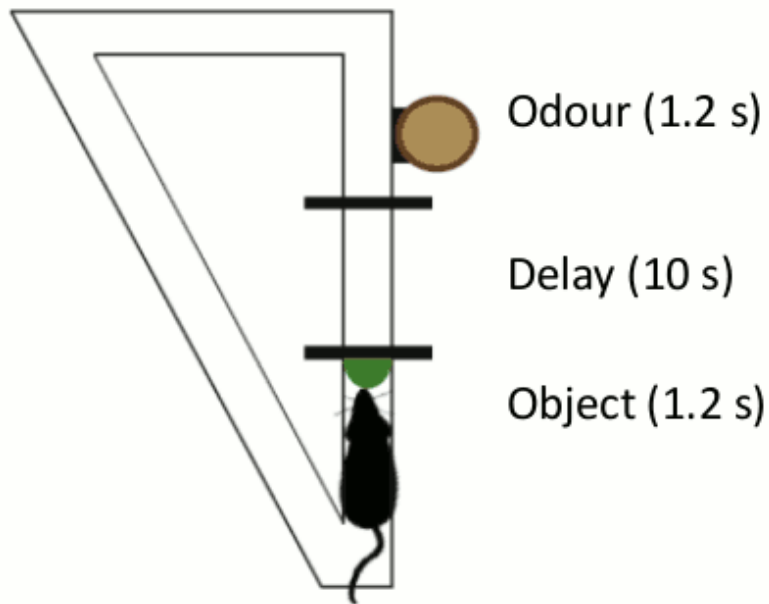
Multi-modality coincidence detection

Recurrent CA3 connections

Possibility to form sequences



Time Cells – Sequence of Cell Activity Encoding Time



McDonald, Eichenbaum *et al.* *Neuron*, 71, 737

Object – Trace – Odour Paired
Associate task ; go/no-go

Space as a confound

Experimental Paradigm

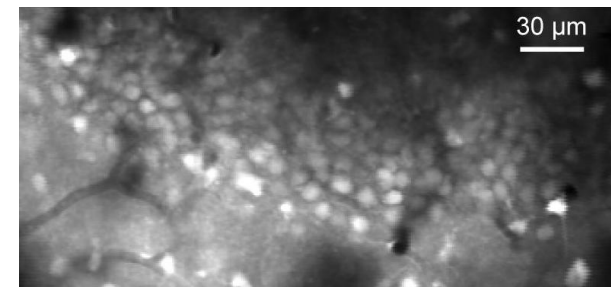
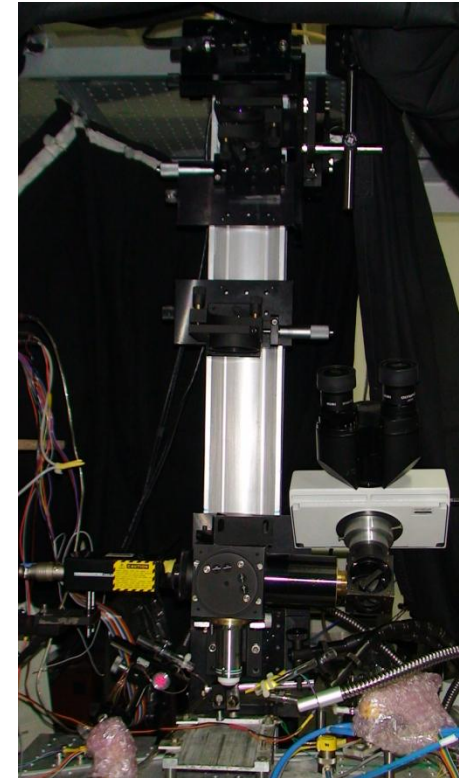
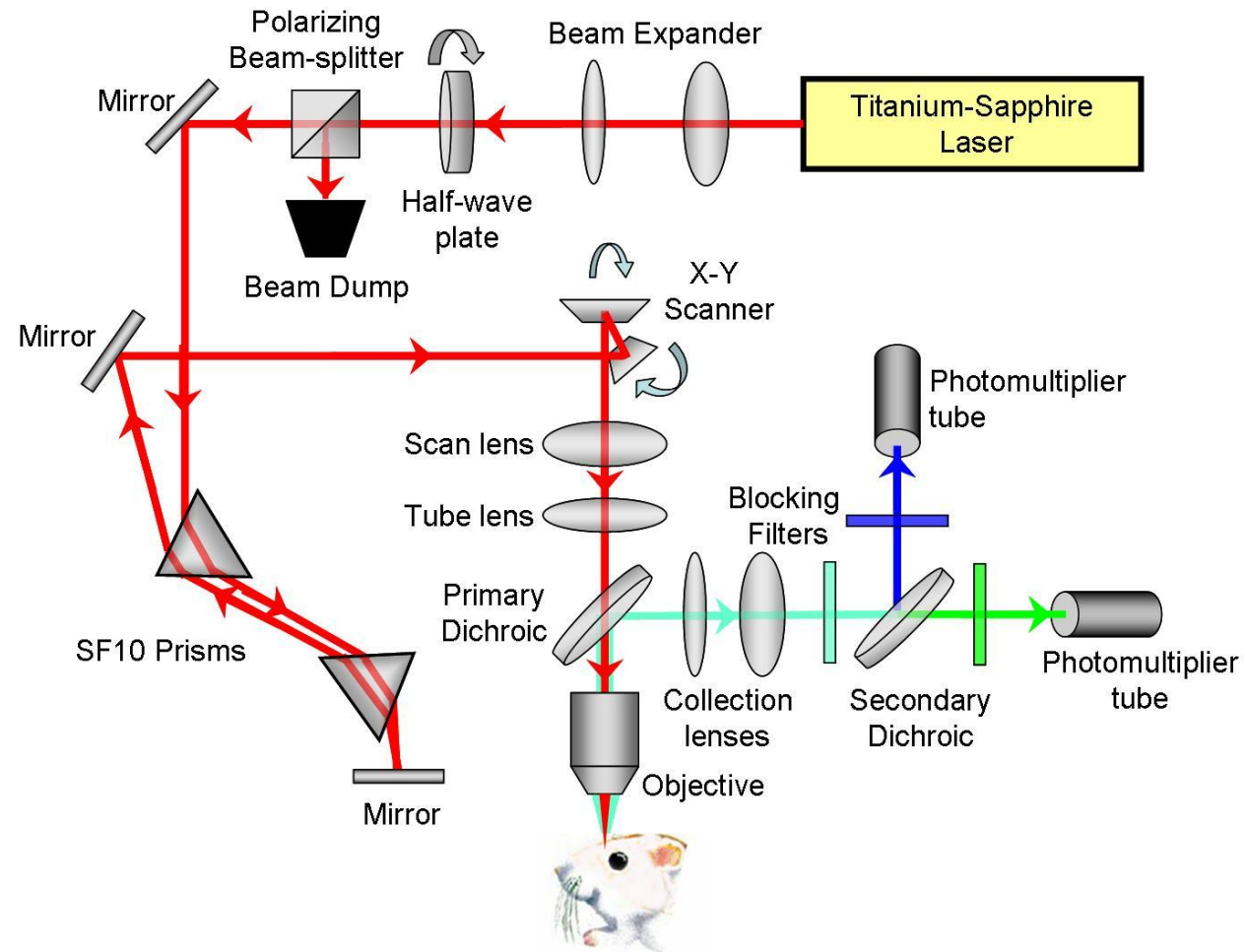
Many neurons (Network phenomenon)

2-Photon Microscopy in hippocampal CA1,
in vivo, awake

Behavioural task - **Head-fixed**, trace maintenance
through time

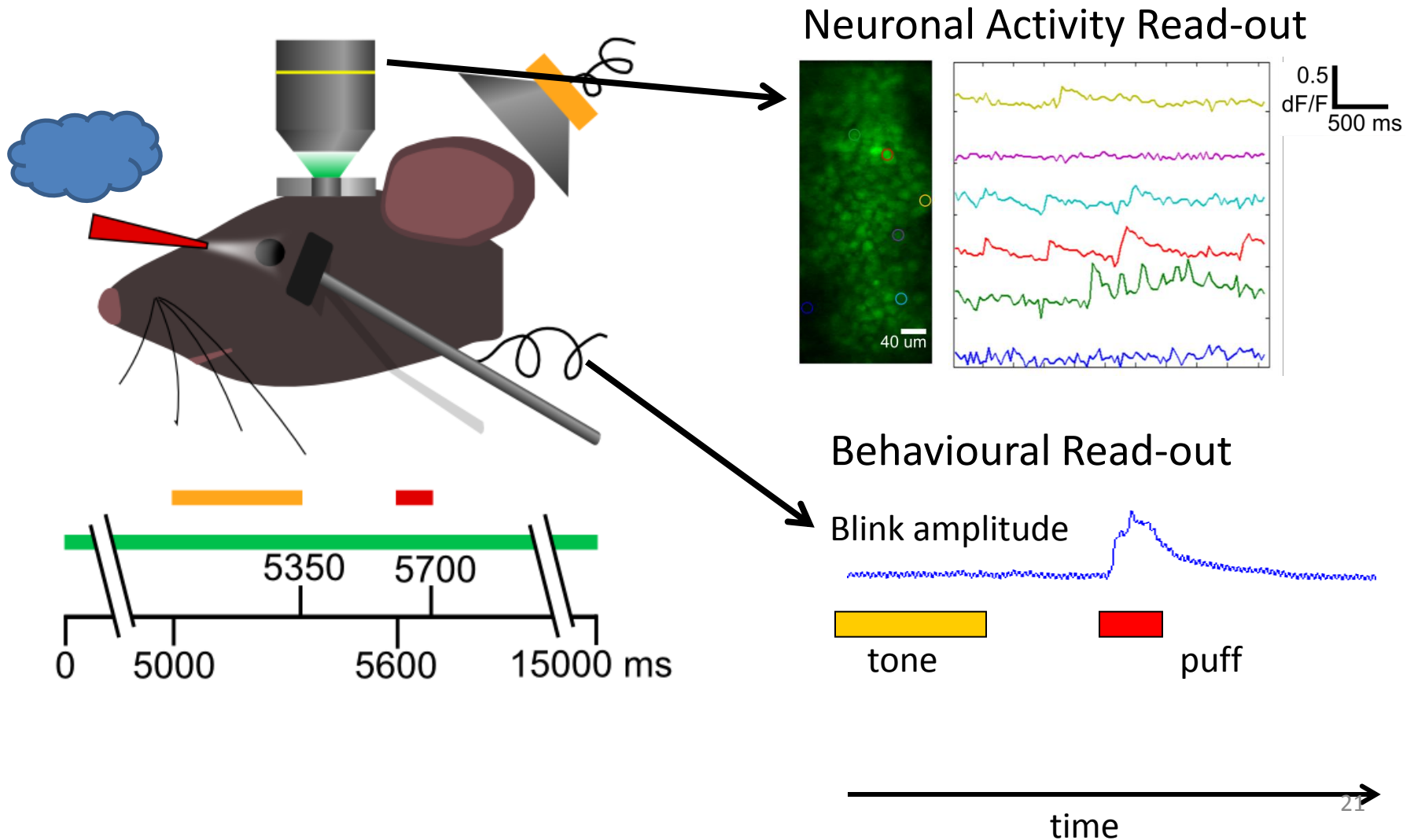
Trace eyeblink conditioning

Imaging of neural activity (in mouse hippocampus)

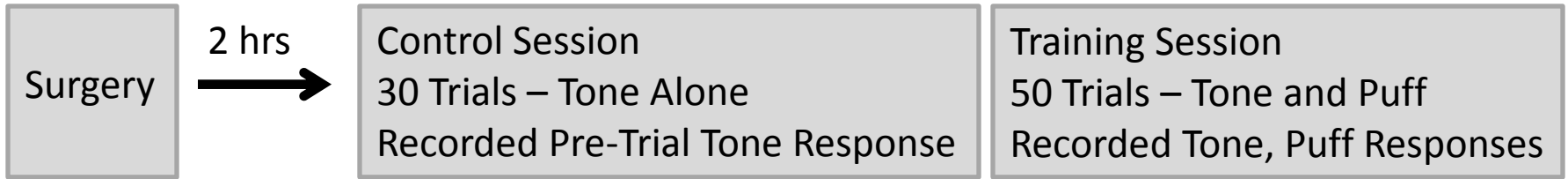


Experimental Paradigm

Trace Eyblink Conditioning

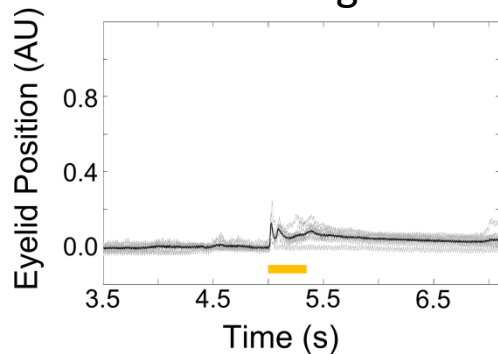


Behaviour Results – Learning in One Session

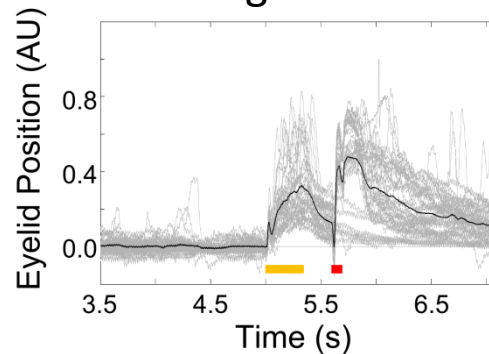


- Mice show detectable **Conditioned Responses (CRs)** within a *single* training session

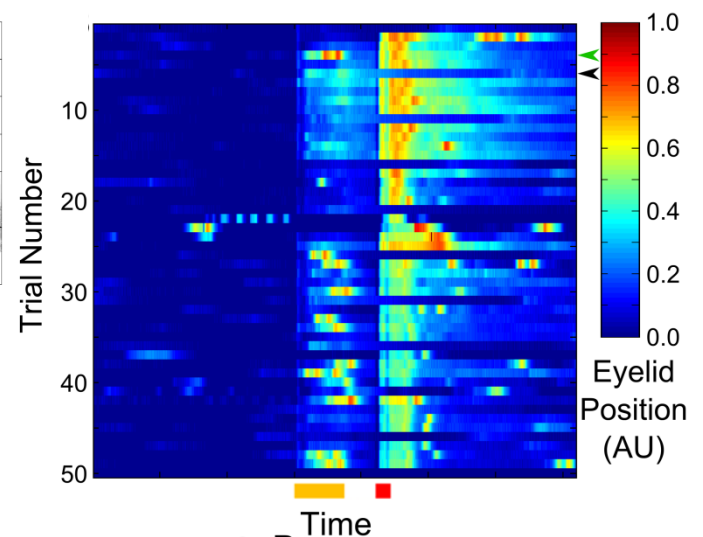
Pre-Training



Training Session



Training Session Trials

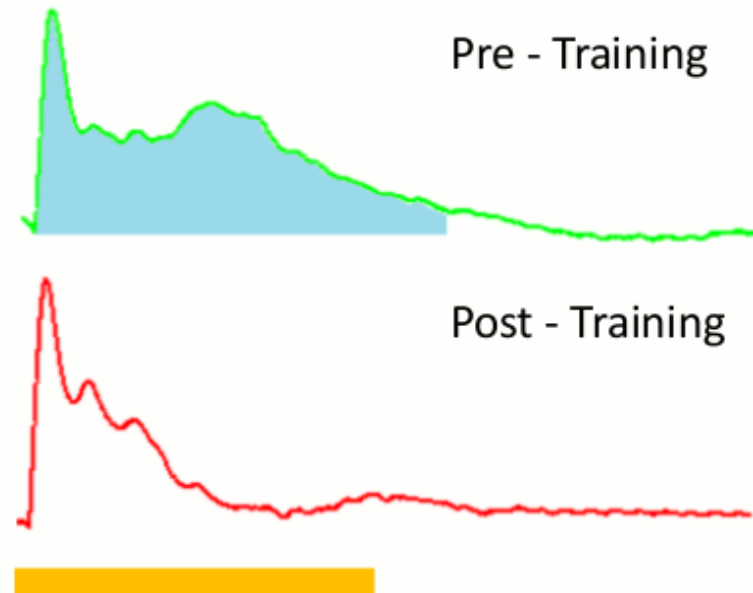


Behaviour Results (Trial Classification)

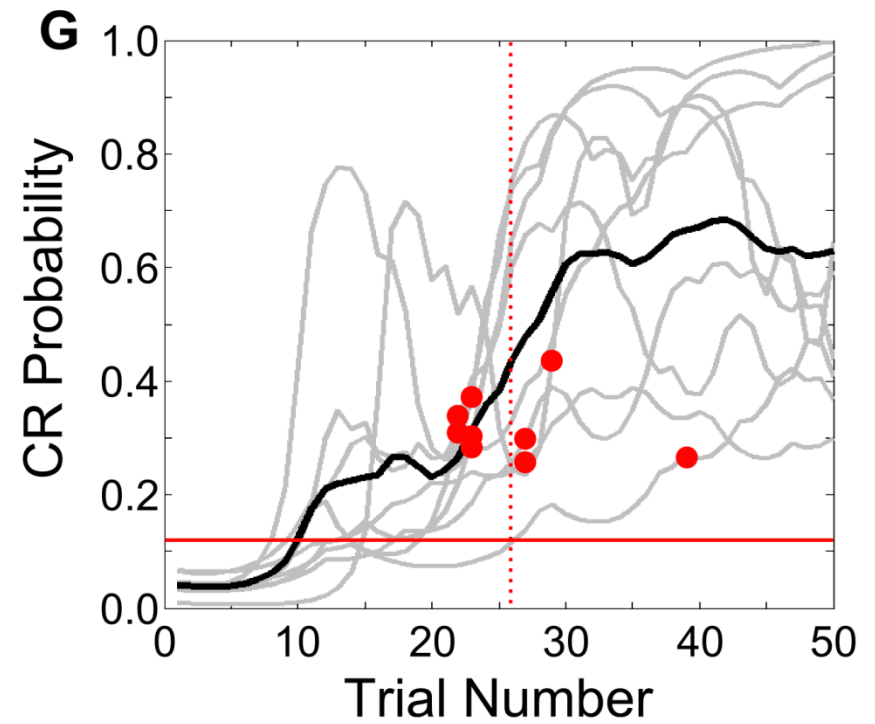
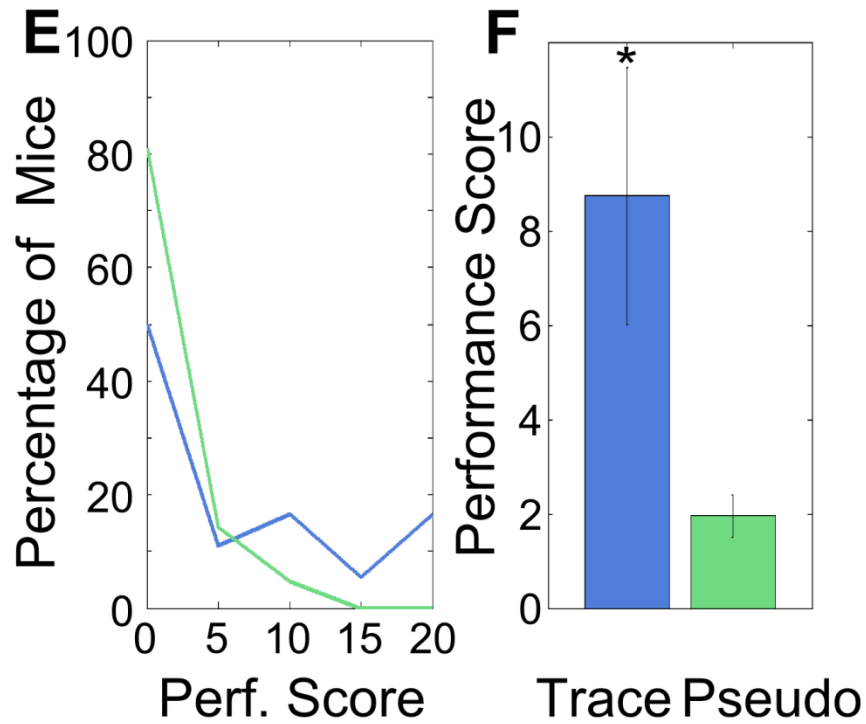
Pseudo-Conditioned Mouse

Threshold =
 $\text{Mean}(\text{AOC}) + 2 \text{SD}(\text{AOC})$

Classify Each Training
Trial based on Threshold

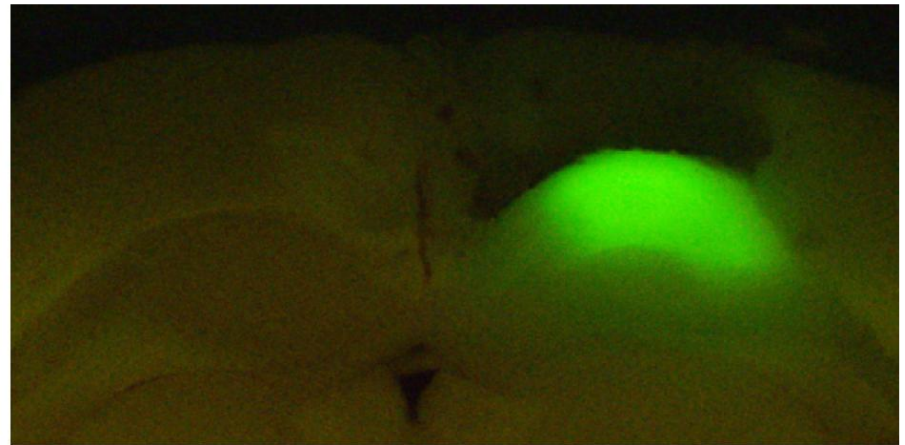
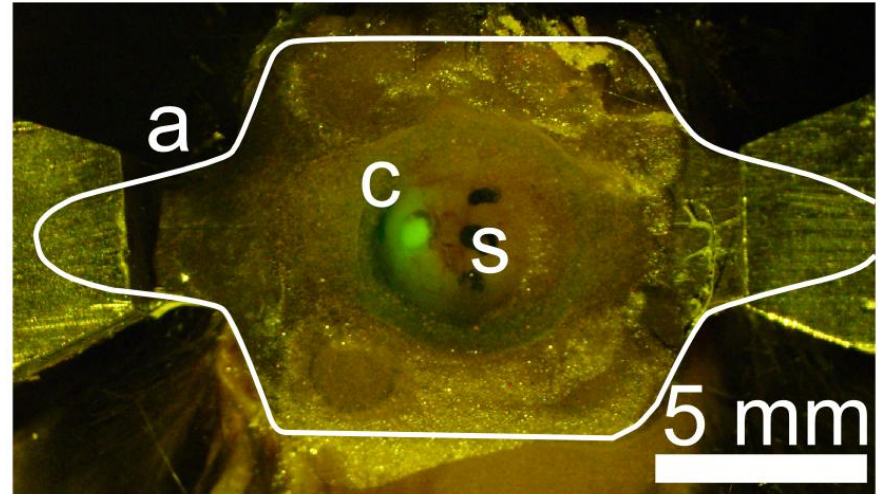
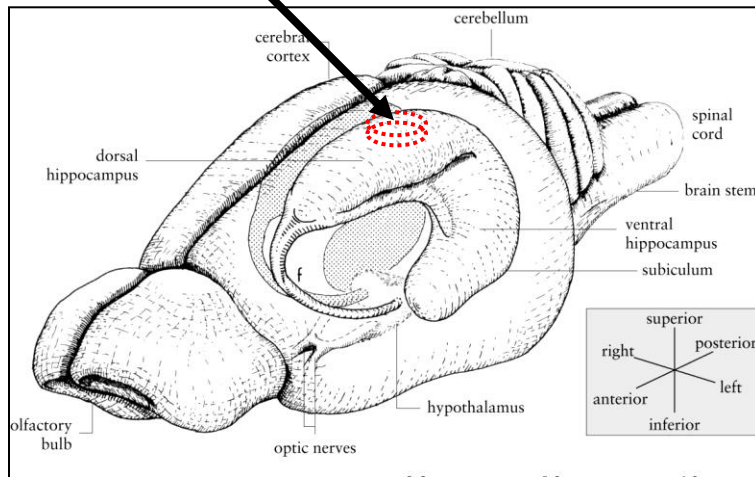


Behavior results



Awake, 2-Photon Imaging of CA1

Craniotomy, Aspirated Hole in Cortex



Awake, 2-Photon Imaging of CA1

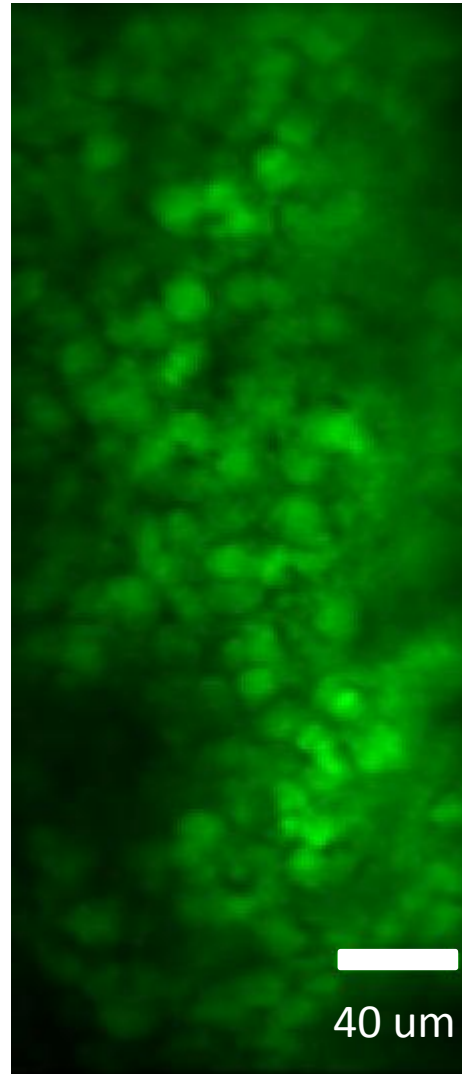
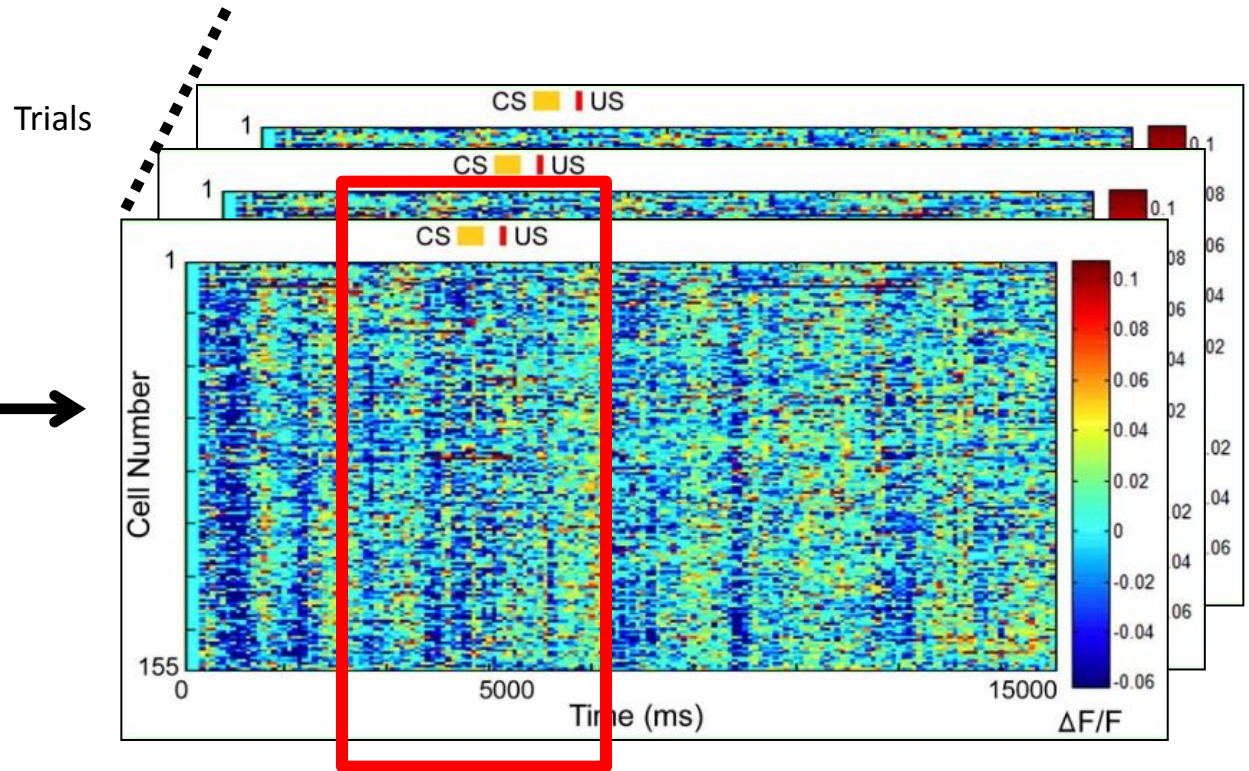
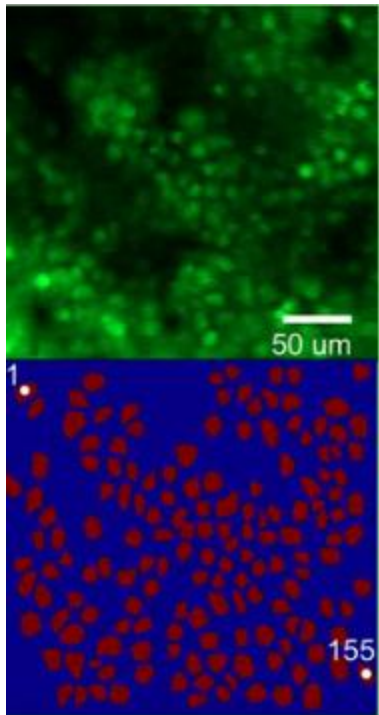
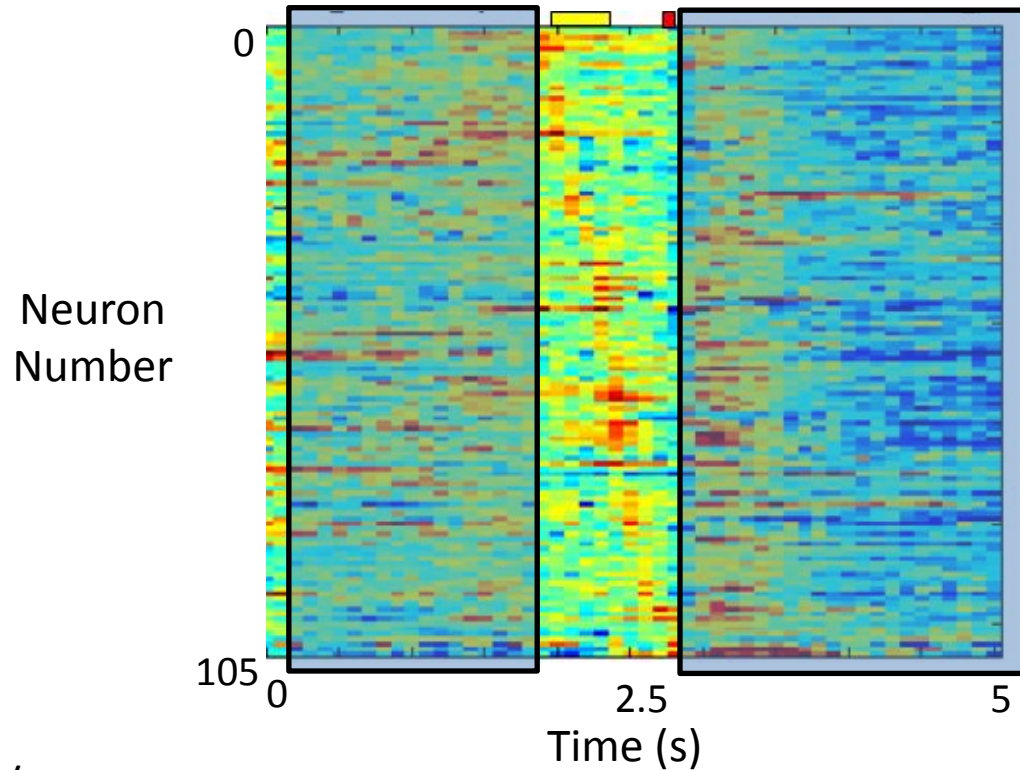


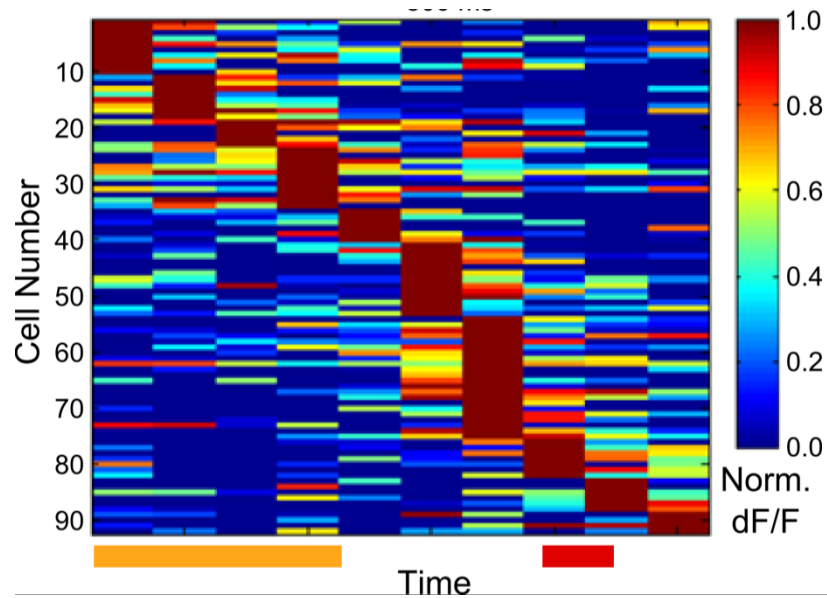
Image Processing



$$\Delta F/F_{\text{frame}i} = \frac{F_{\text{frame}i} - F_{\text{baseline}}}{F_{\text{baseline}}}$$

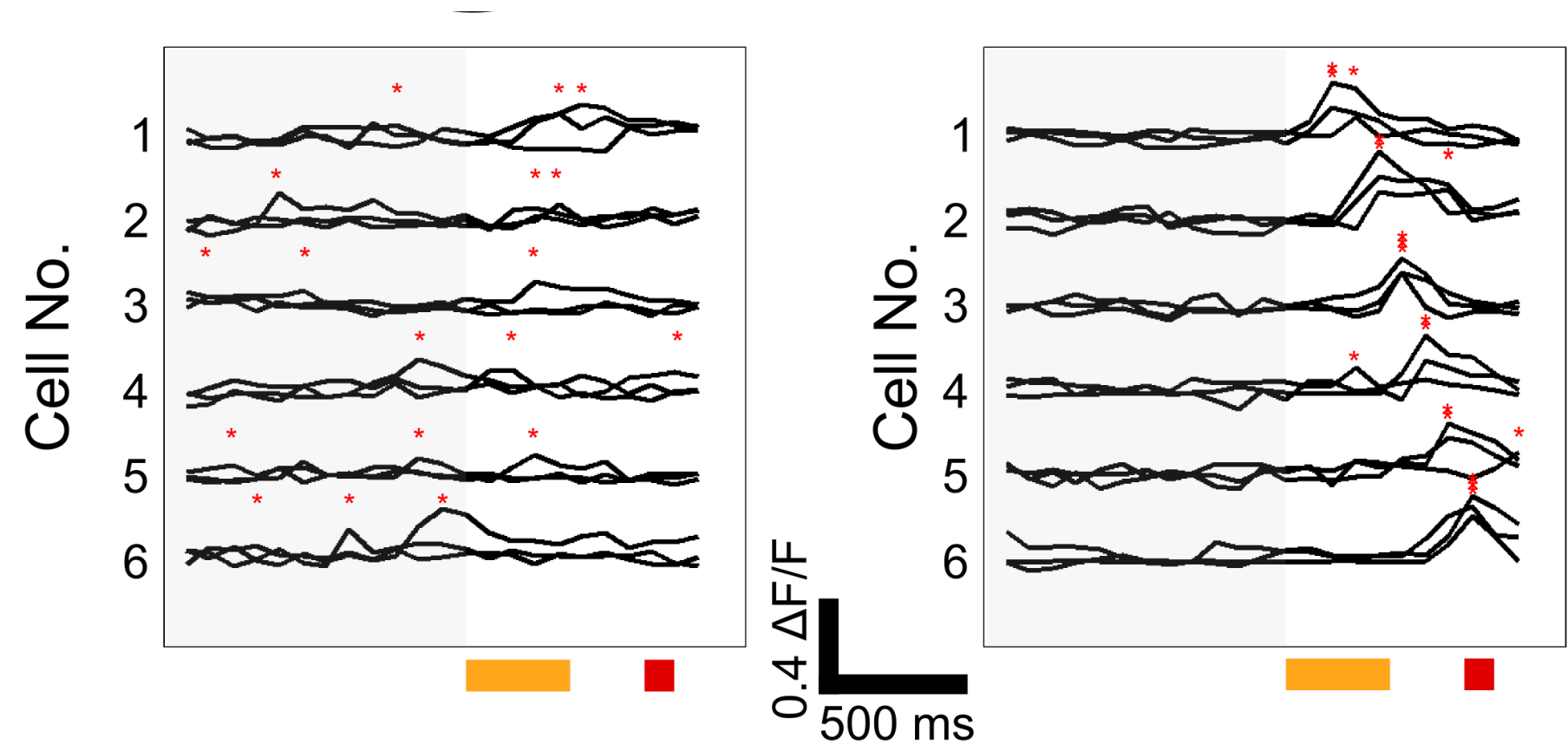


Each cell's dF/F
response
Normalised



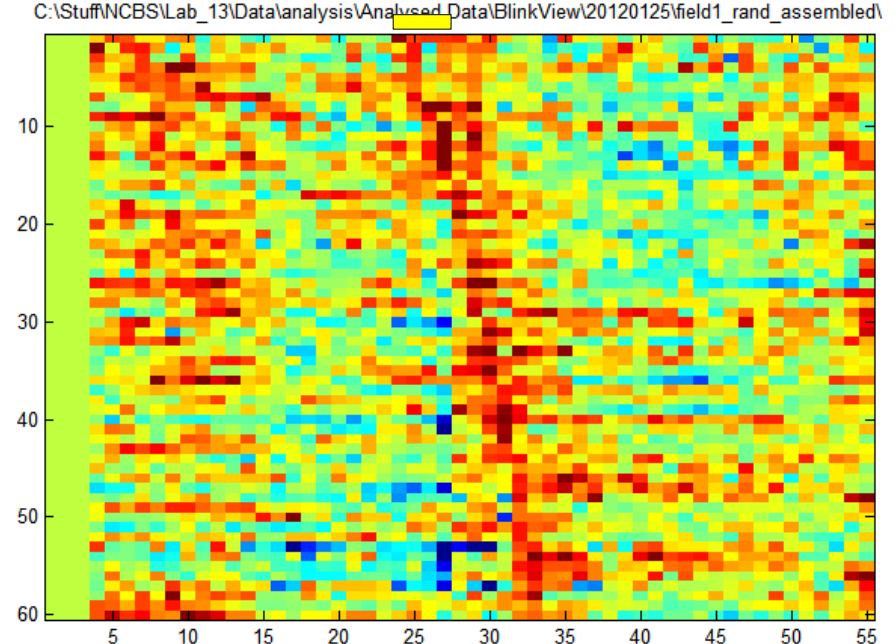
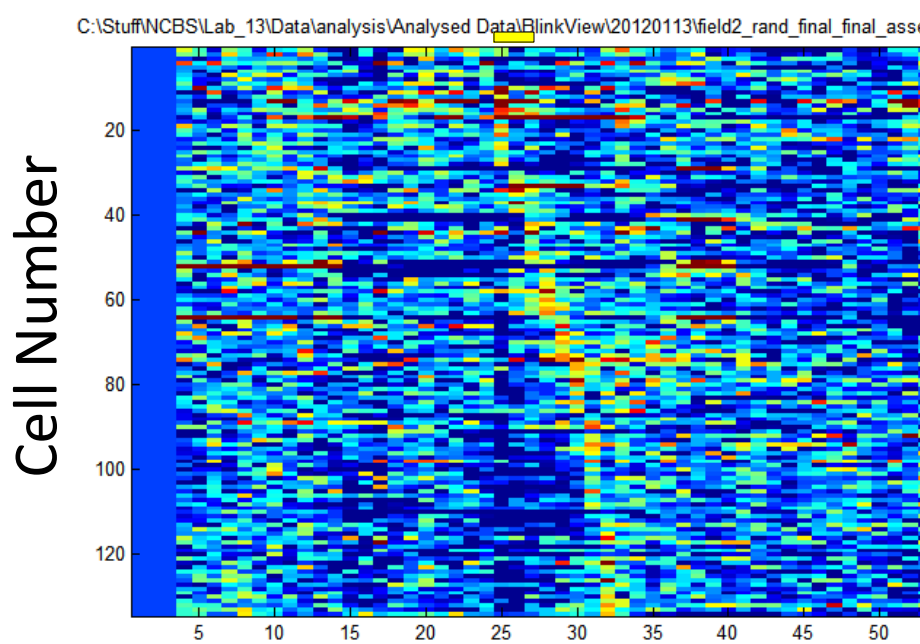
Fluorescence before and after learning

Same 6 cells



Time Cells in Pseudo-conditioned Mice

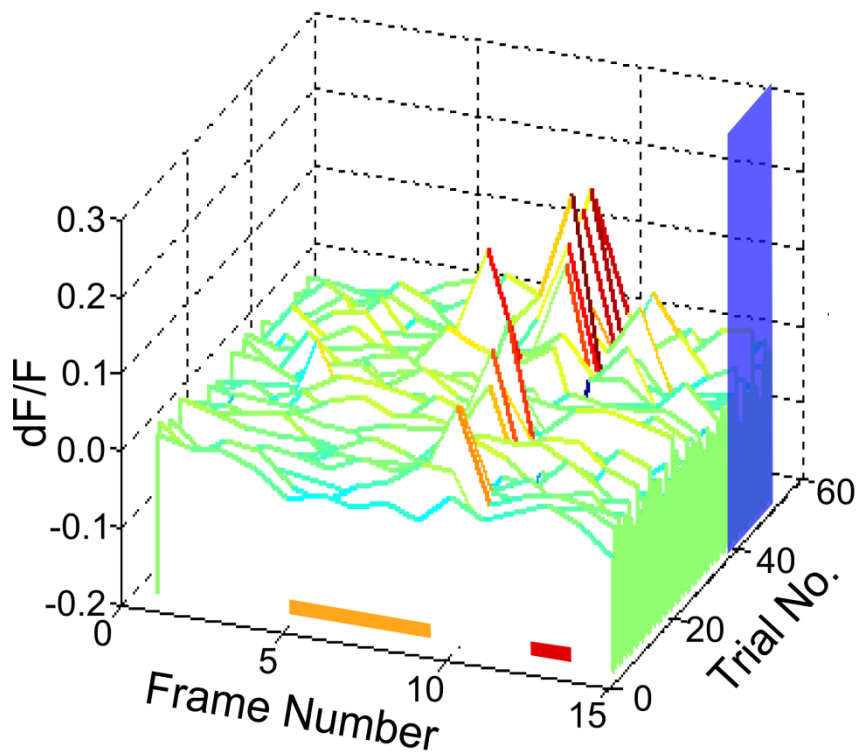
Do Time Cells have relevance to the Task?



Frame Number

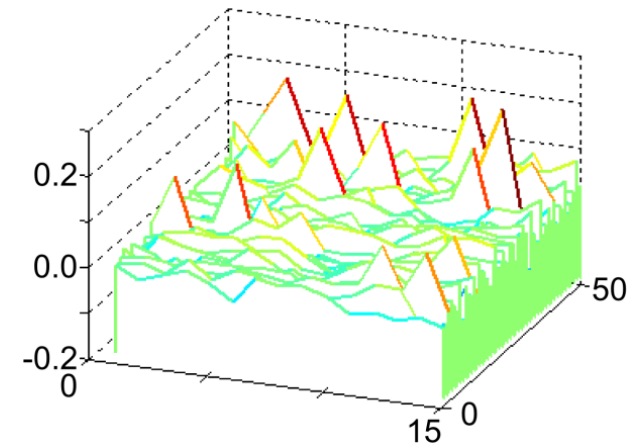
Ridge:Background Ratio – Measures time-specific firing of cells

Time-Aligned dF/F Traces for a cell

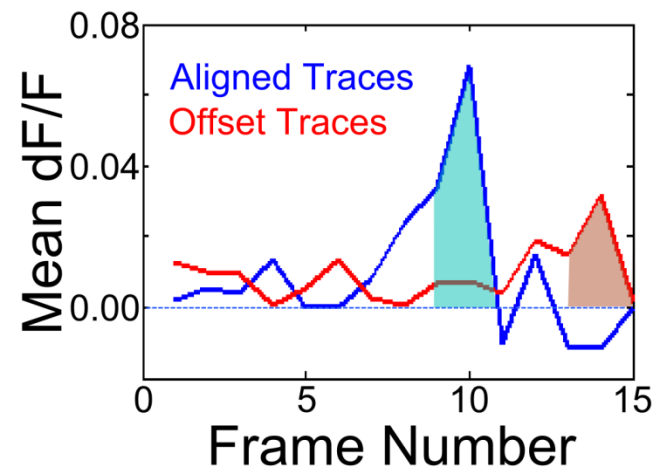


Ridge:Background Ratio = Shaded Area/Area under Rest of the Curve

Randomly Offset dF/F Traces

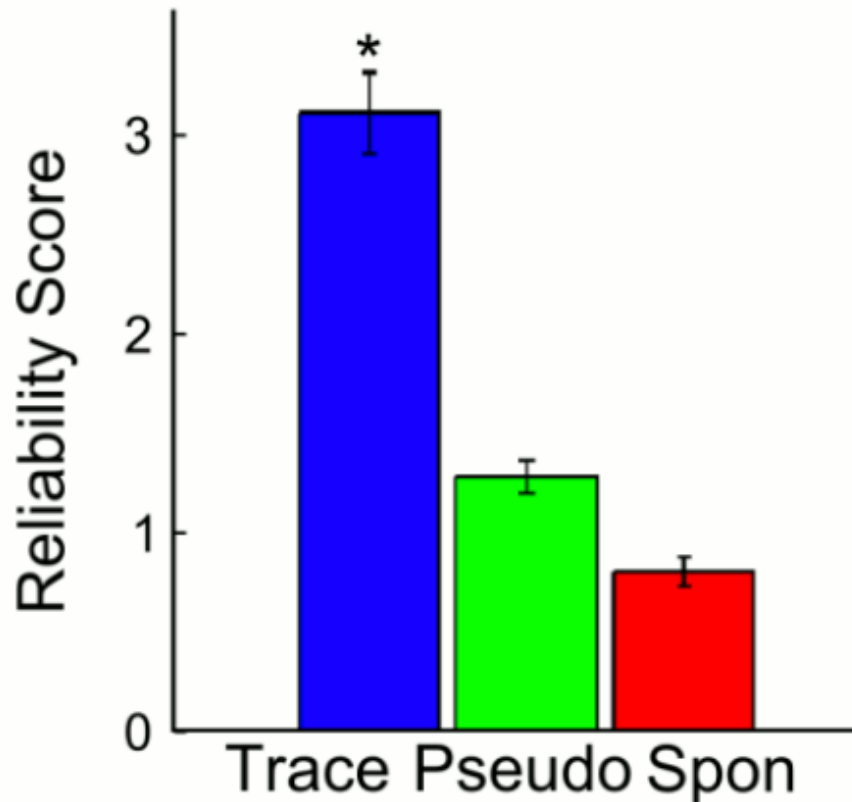


Averaged Traces



Reliability Score – cells more reliable in Trace than in Pseudo, Spontaneous

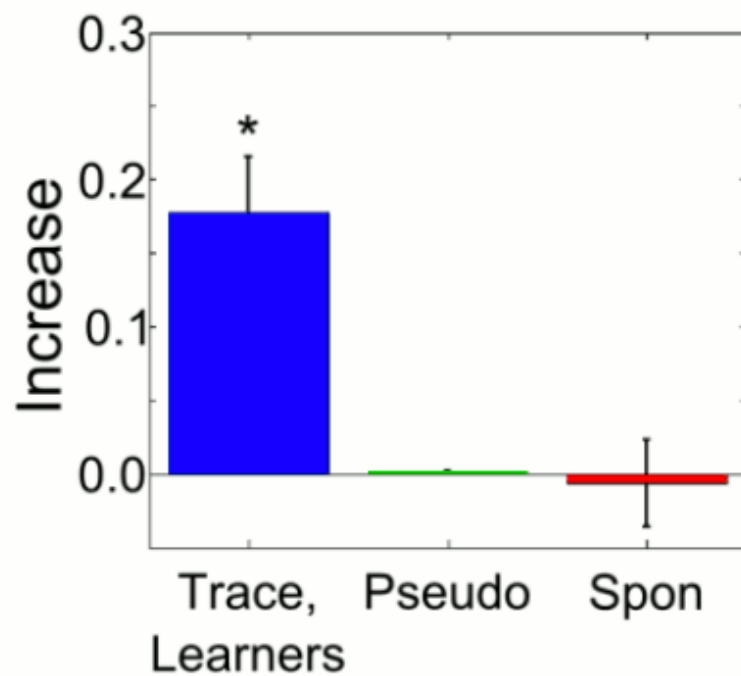
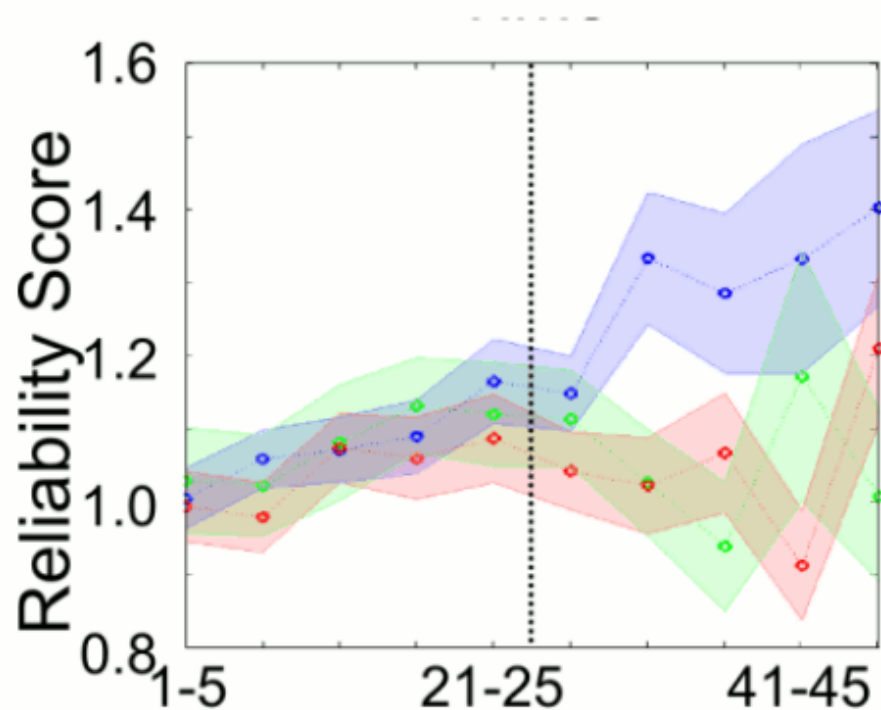
Trace Learners have high R:B Ratio, compared to randomly offset control



ANOVA $p \ll 0.01$, Tukey
Kramer h.s.d.

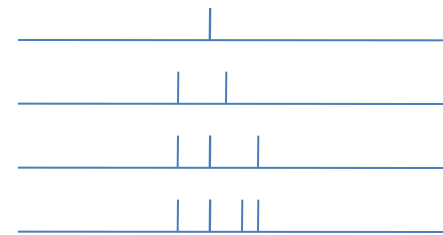
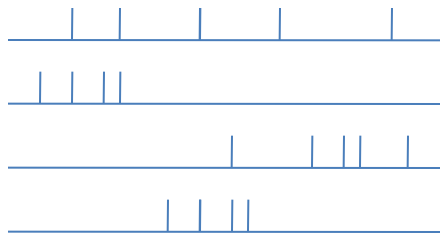
Time Tuning Change Gradually, with Training

dF/F amplitude at time-Tuning centre increases with training

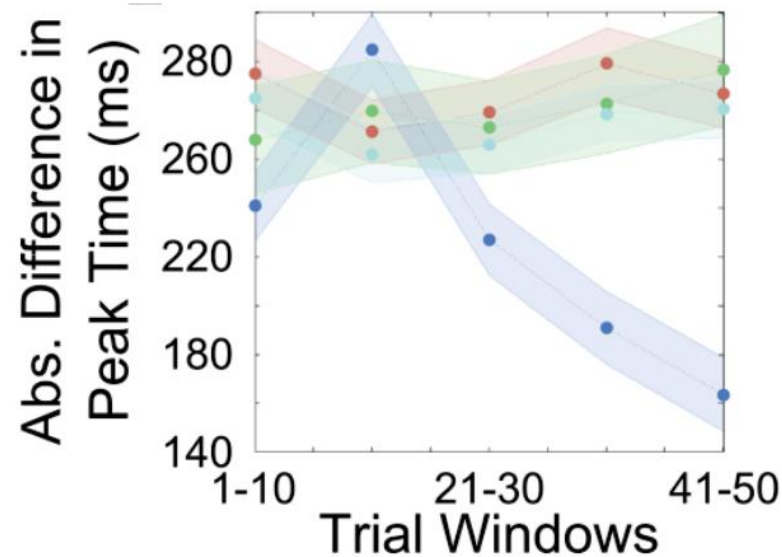


ANOVA $p < 0.01$, Tukey
Kramer h.s.d.

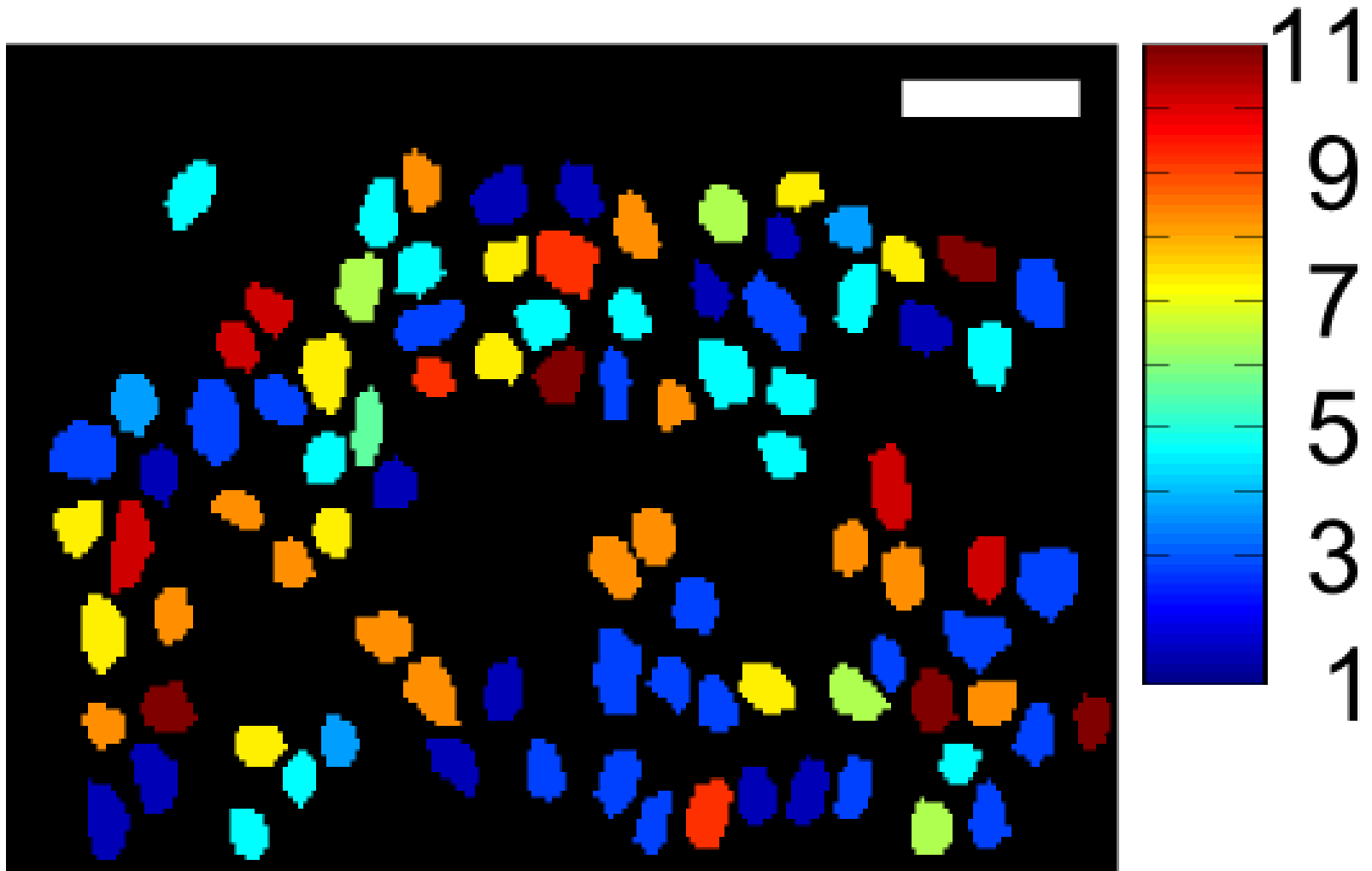
Does timing improve or firing probability improve?



Does timing improve or firing probability improve?

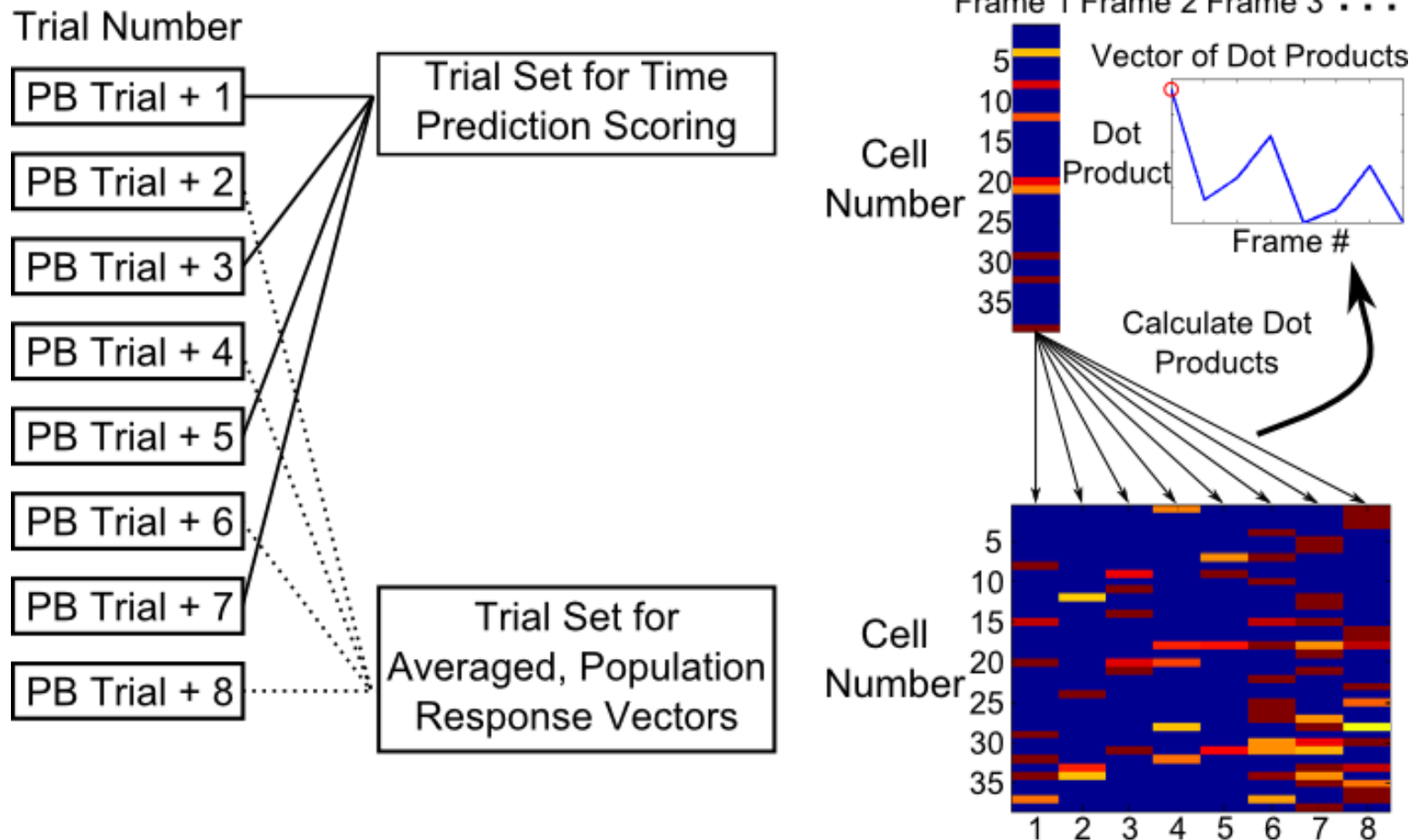


There is no spatial organization of time selective cells



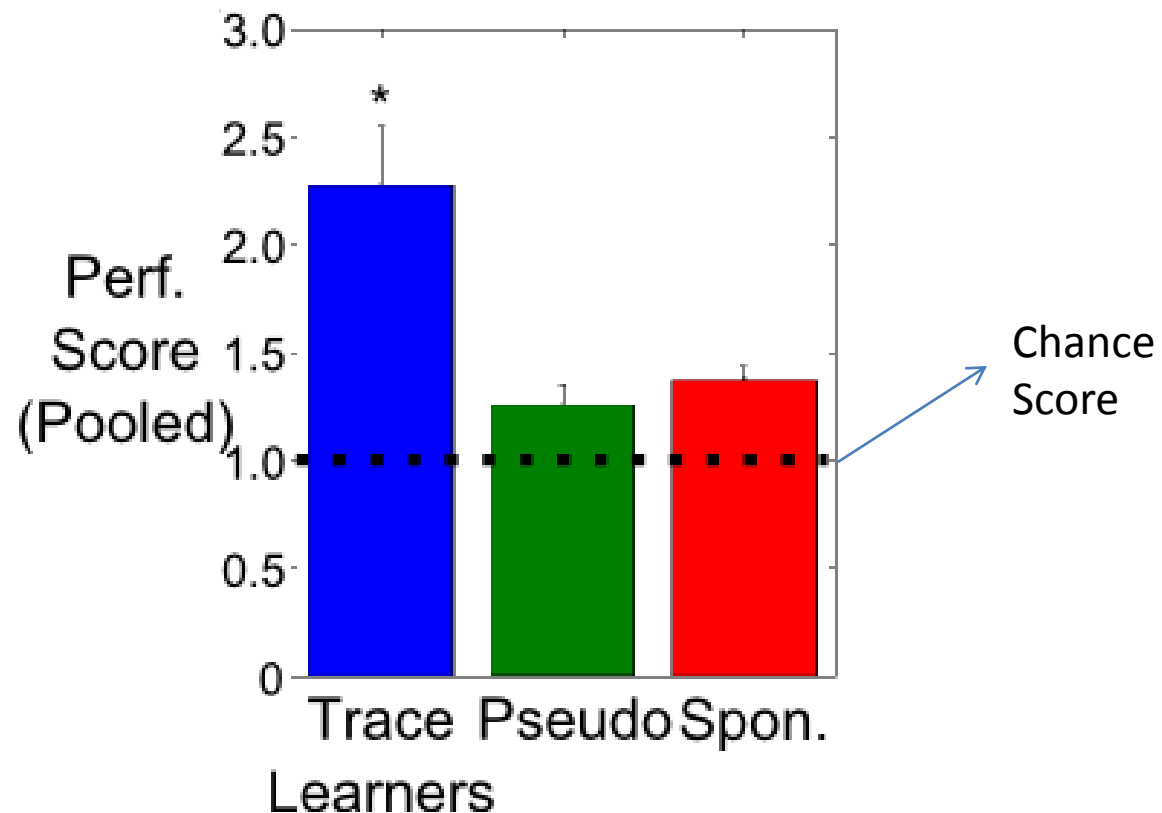
Can we decode time from activity in a single frame?

Schematic of Template-Matching Decoder



Single Trial decoding of time from dF/F population activity

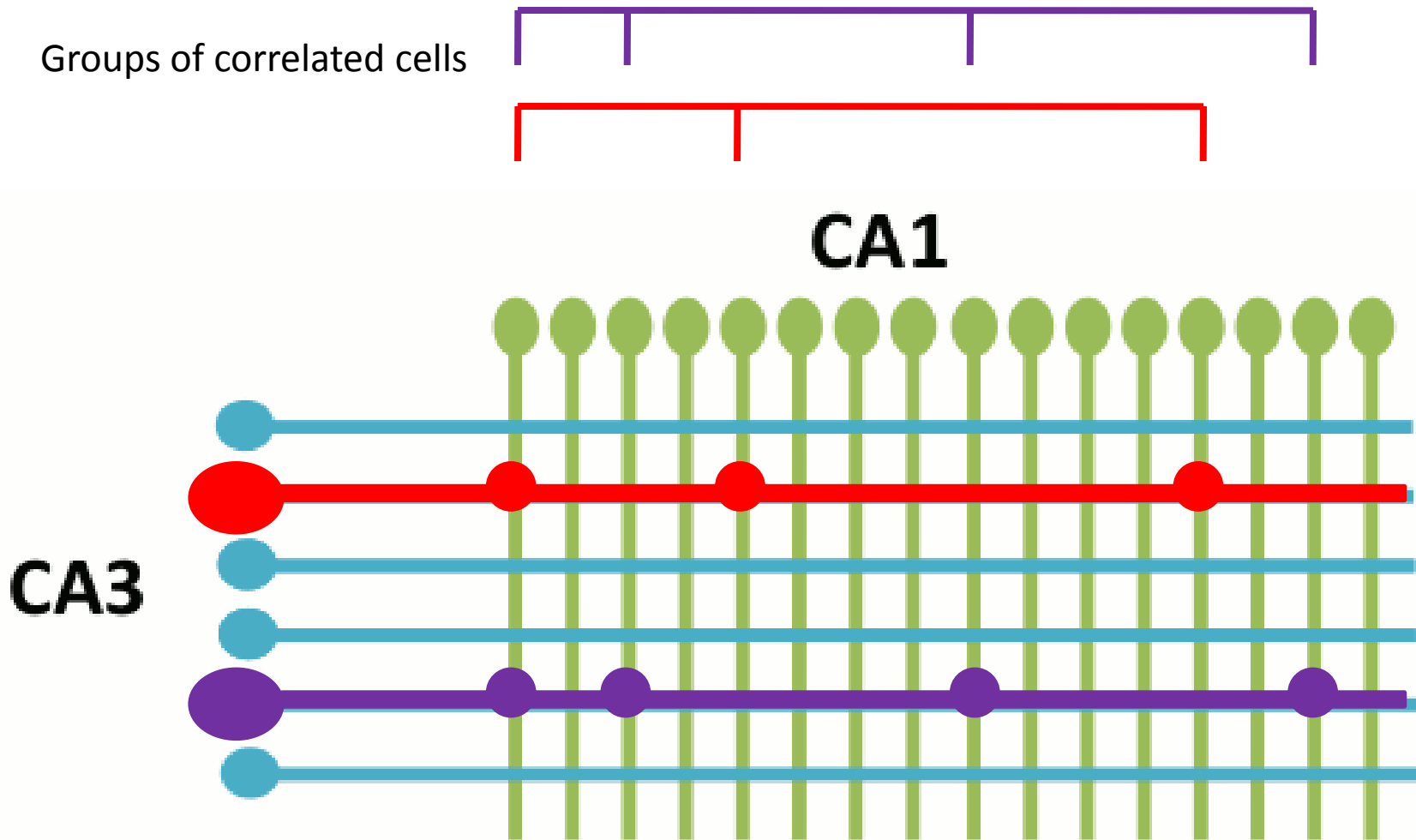
Trace Learners have Higher Decoder Performance Scores than Pseudo-conditioned and Spontaneous Data Scores



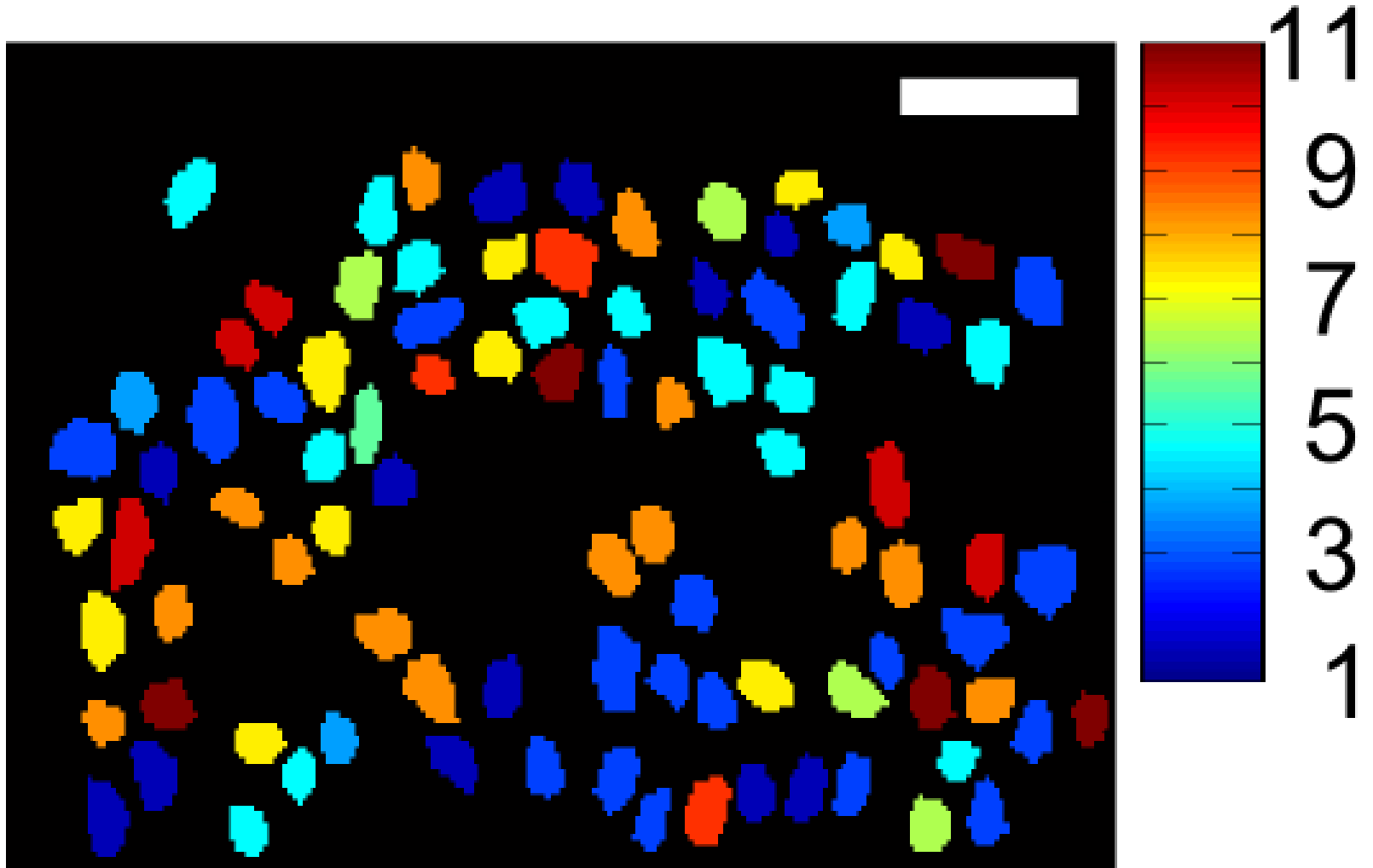
Questions on network learning

- What changes occur in activity?
- What changes occur in connectivity?
- What are the rules?
- How does multiscale signaling implement these rules?

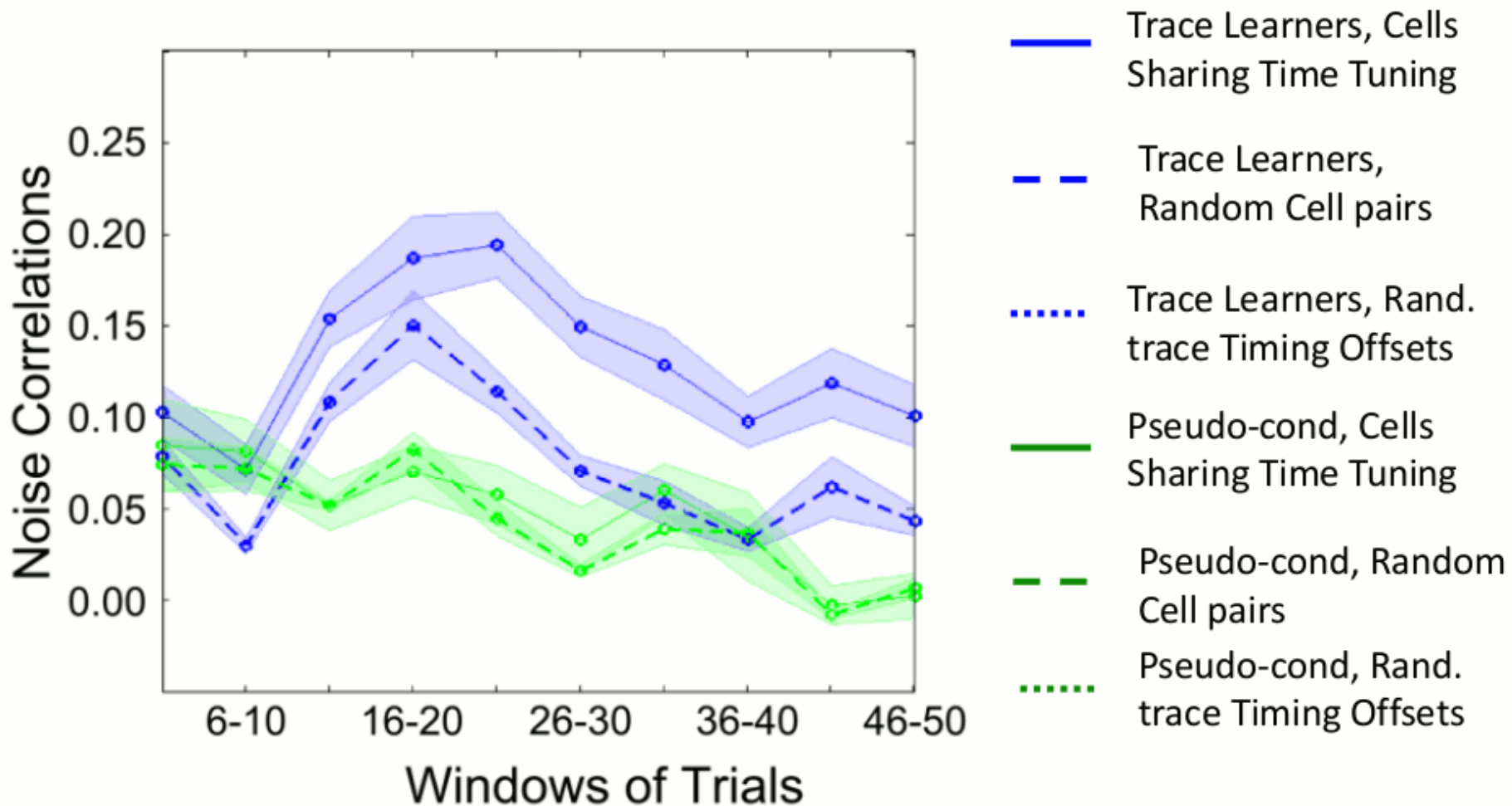
Connectivity and correlations



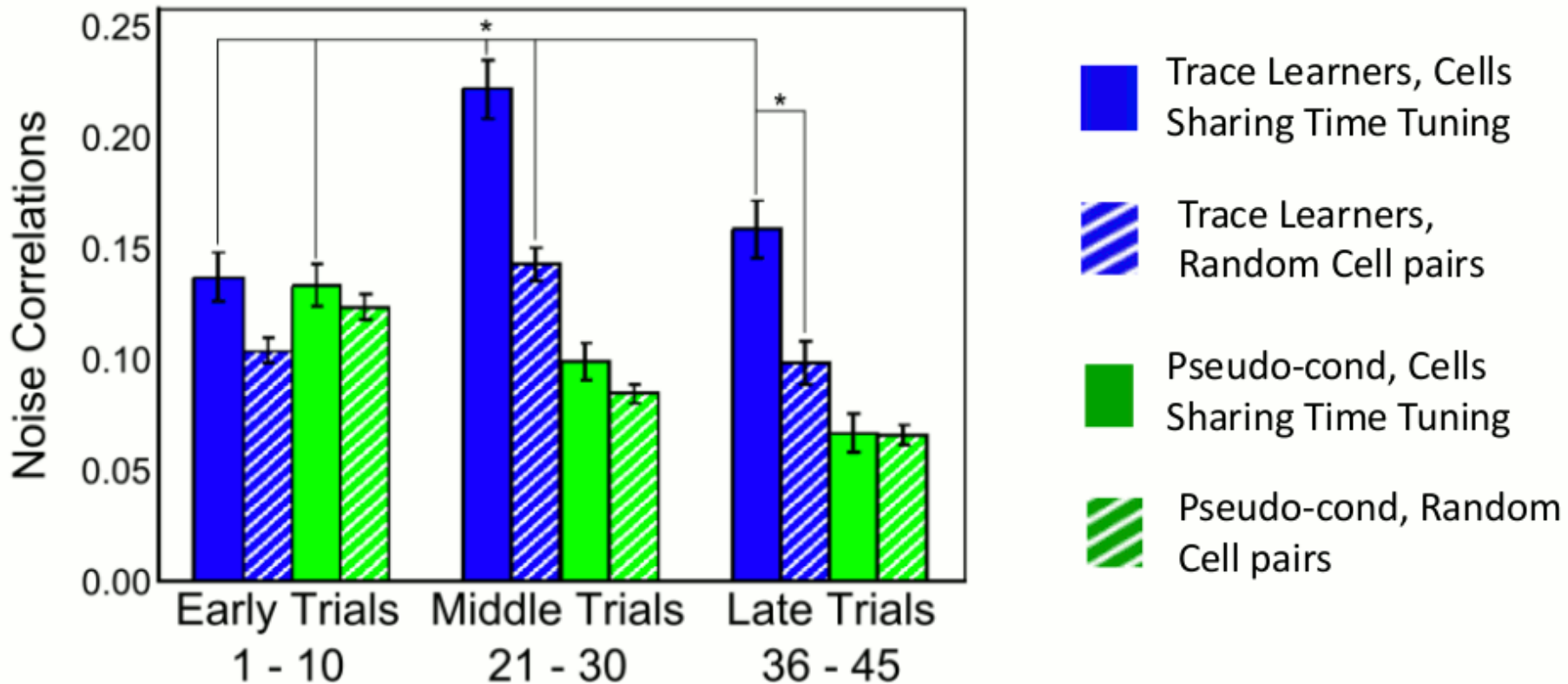
What happens to correlations between time selective cells?



Background Period Time-Cell Activity Correlations Increase During Training

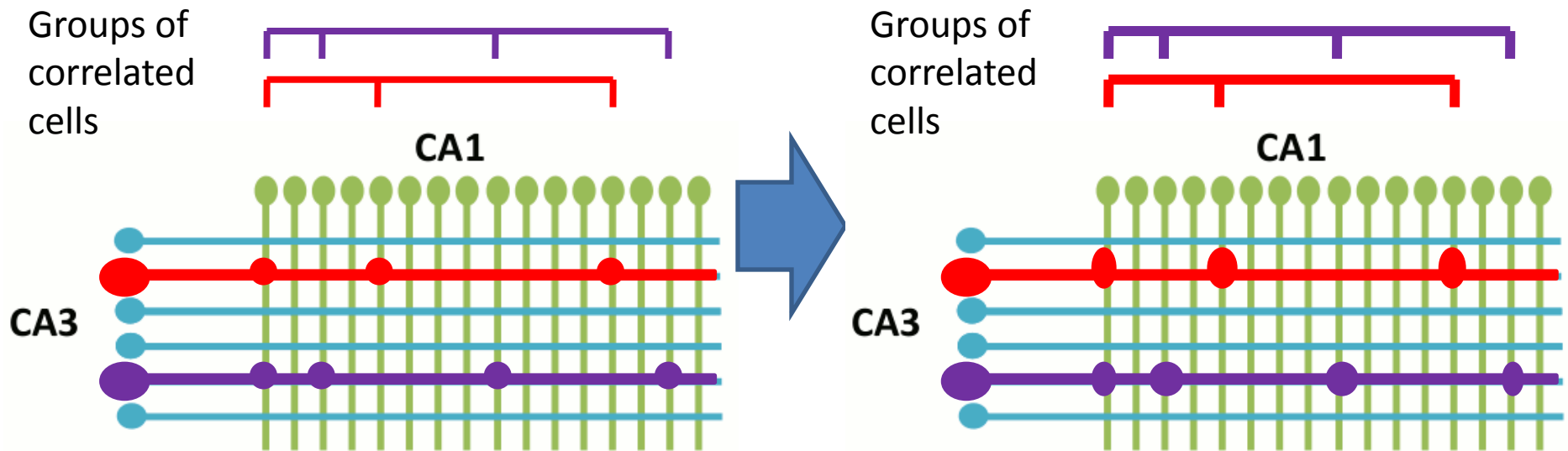


Background Period Time-Cell Activity Correlations Increase During Training

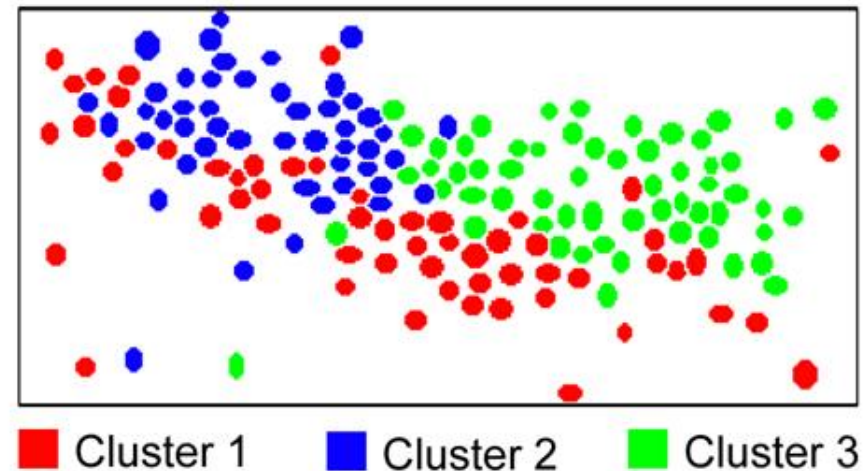
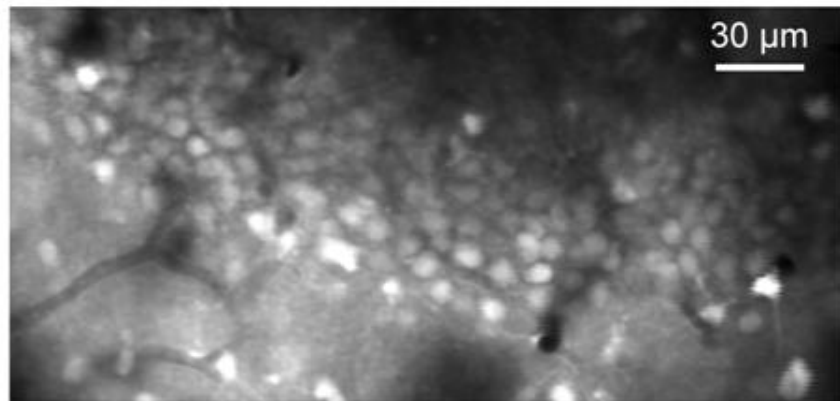
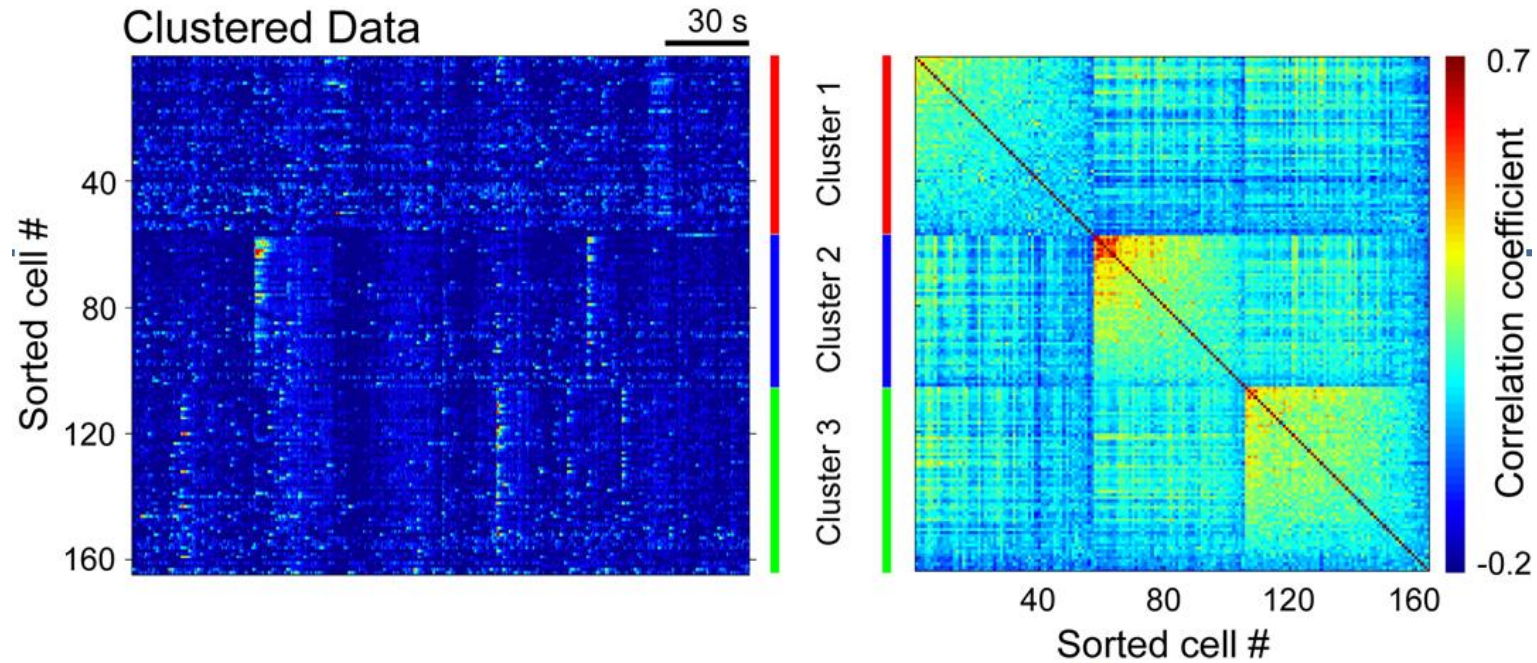


$p < 0.01$, ANOVA followed by Tukey-Kramer h.s.d.

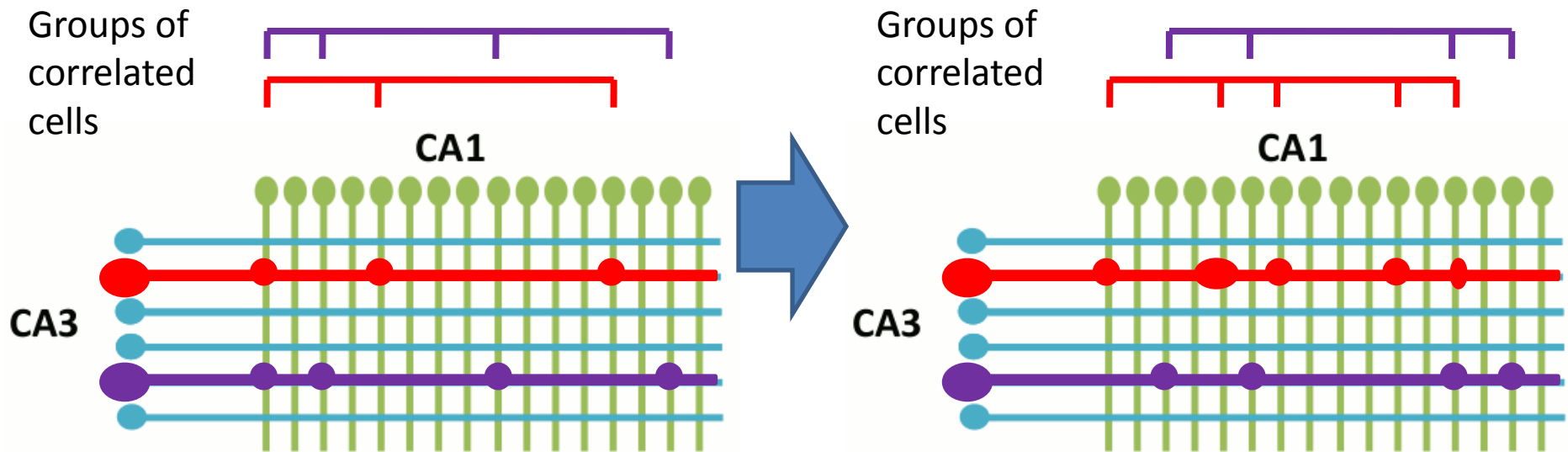
Cells with the same time-tuning become more correlated



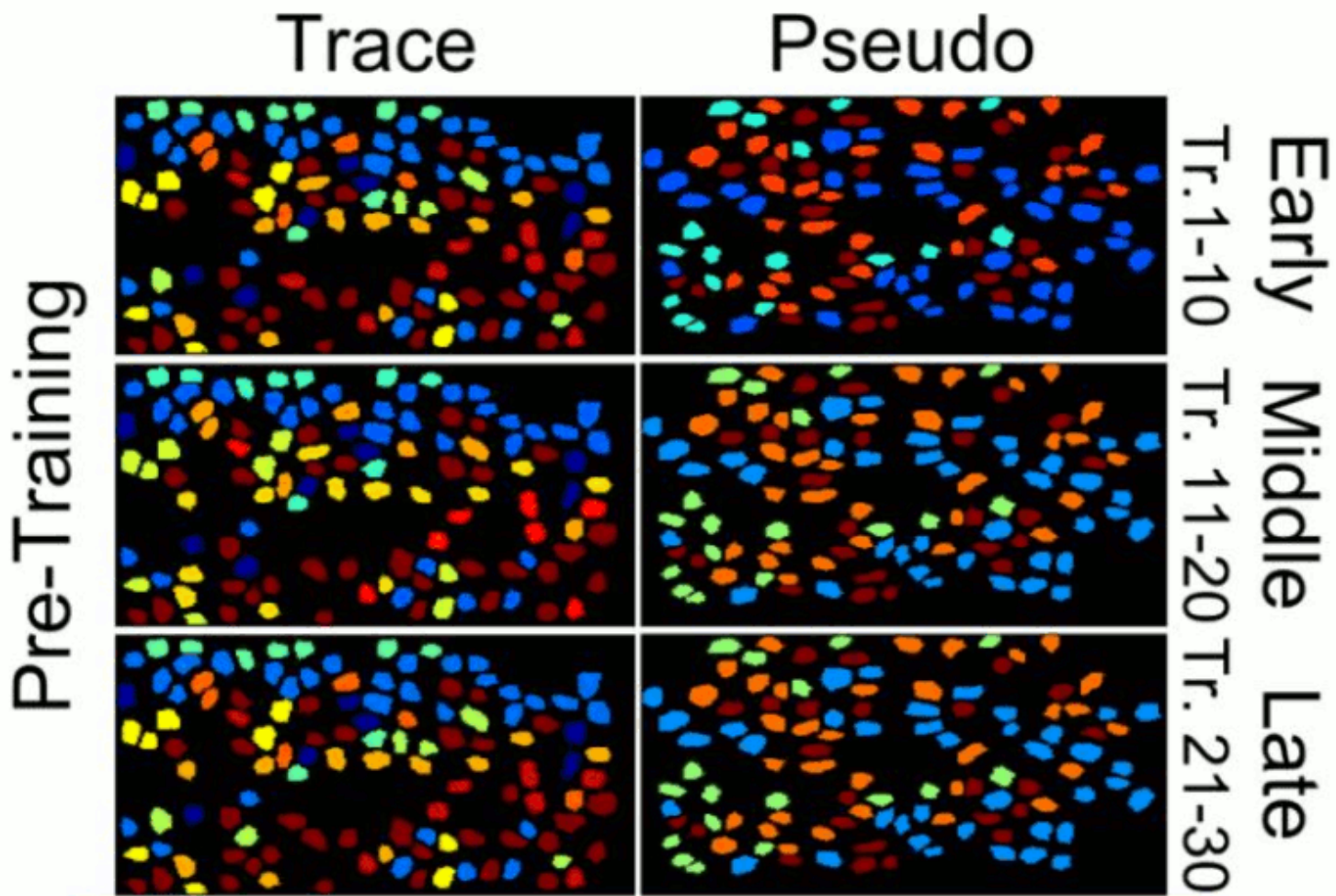
Cells cluster into correlated groups *before* training



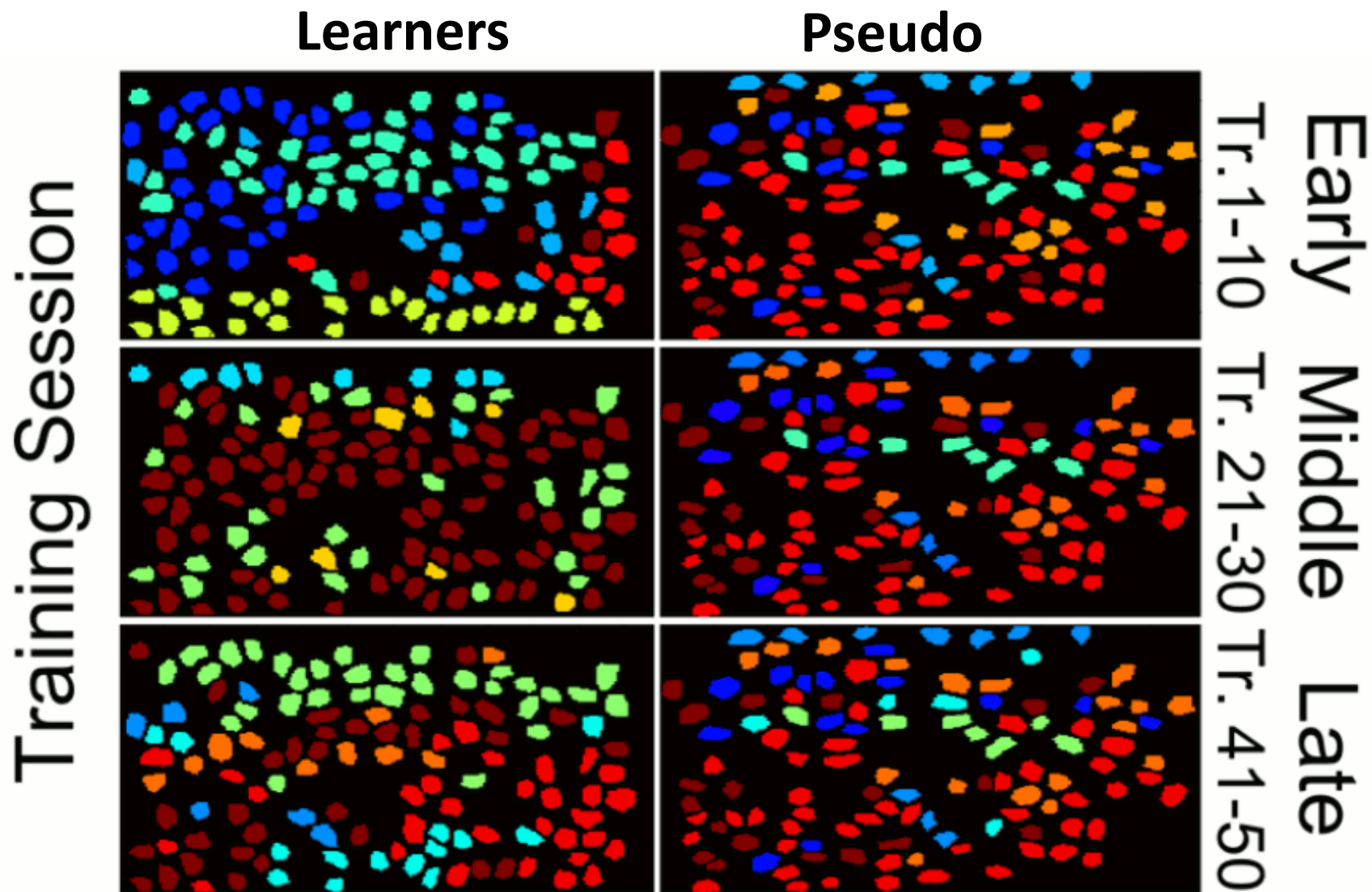
Correlations change if network learns



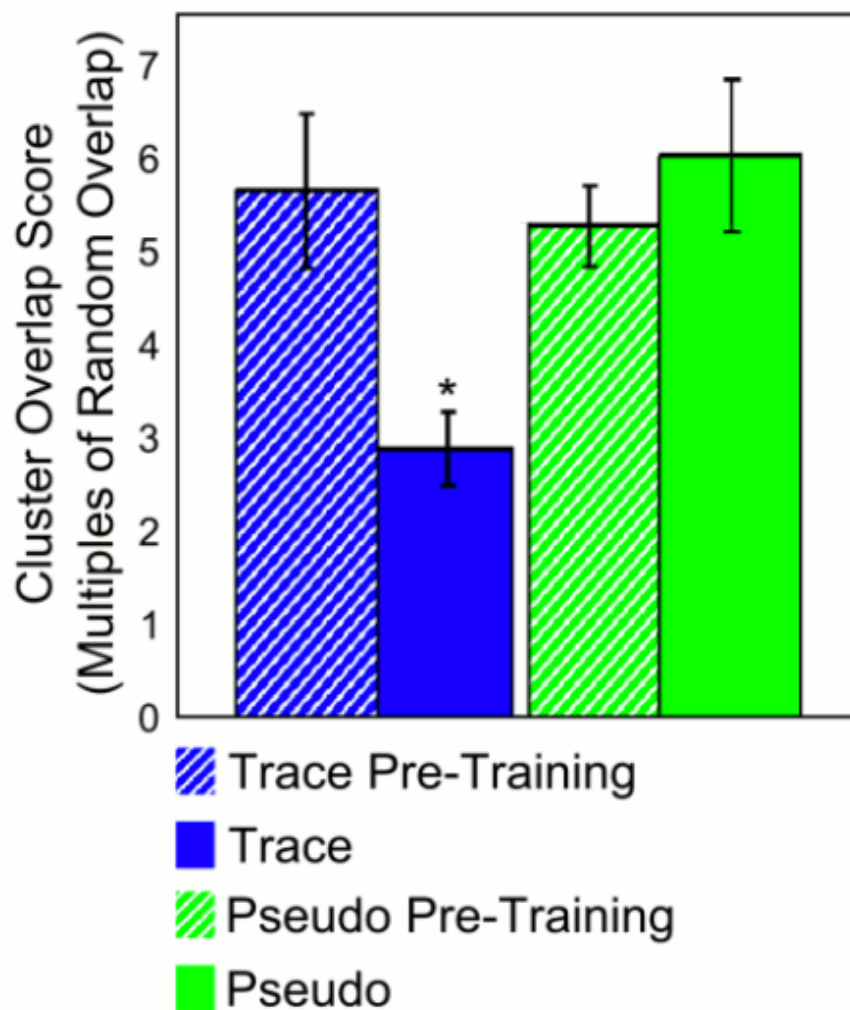
Cell-clusters are Stable Prior to Training



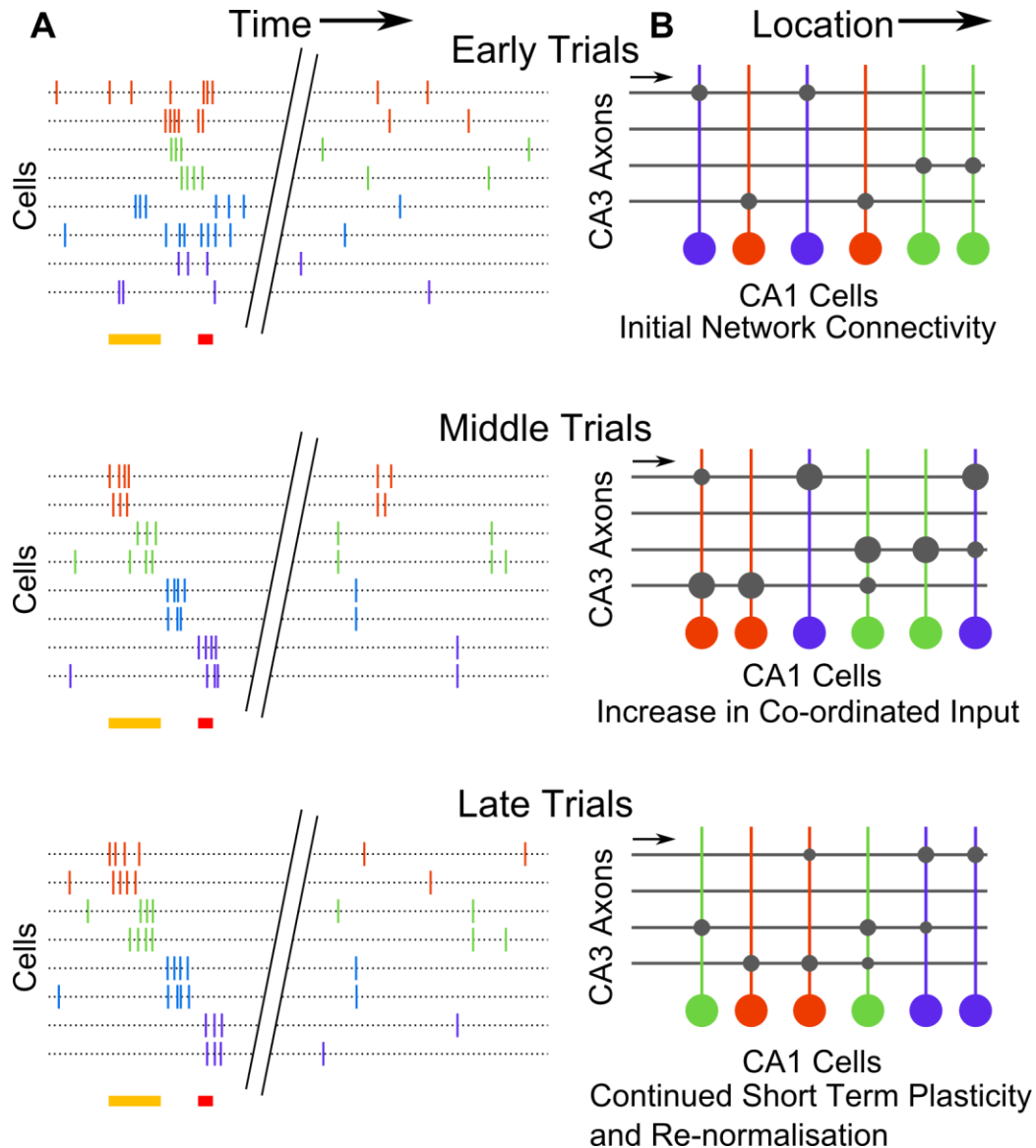
Cell clusters are destabilized only in learners



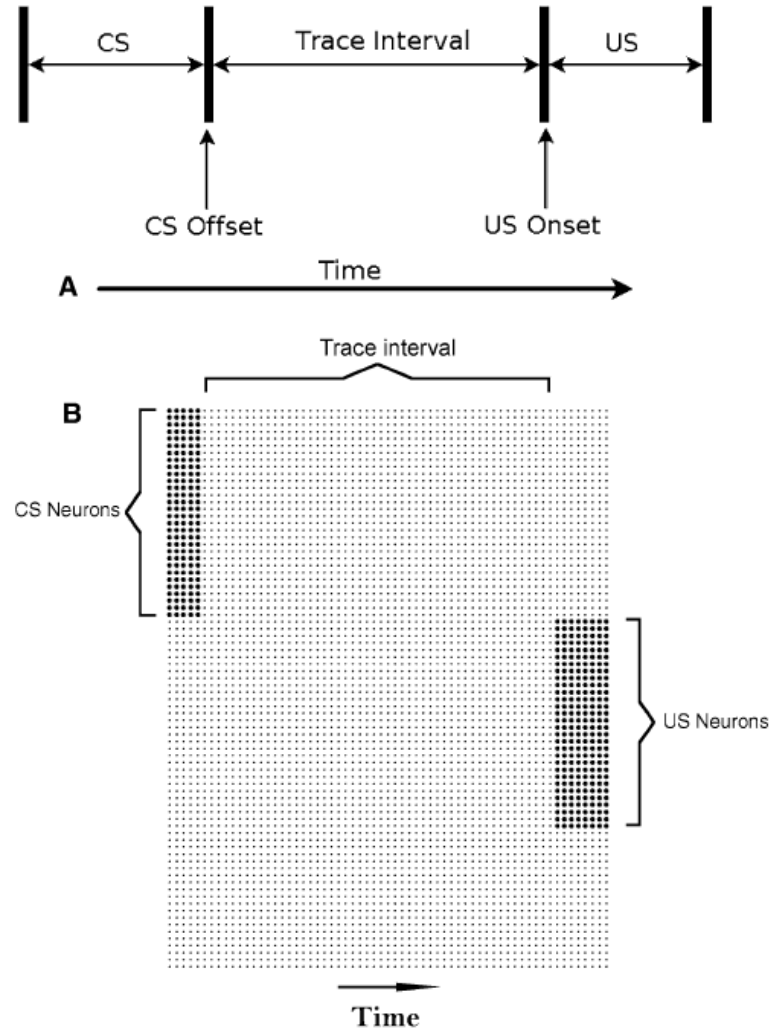
Cell-clusters are De-stabilised only in Trace Learners



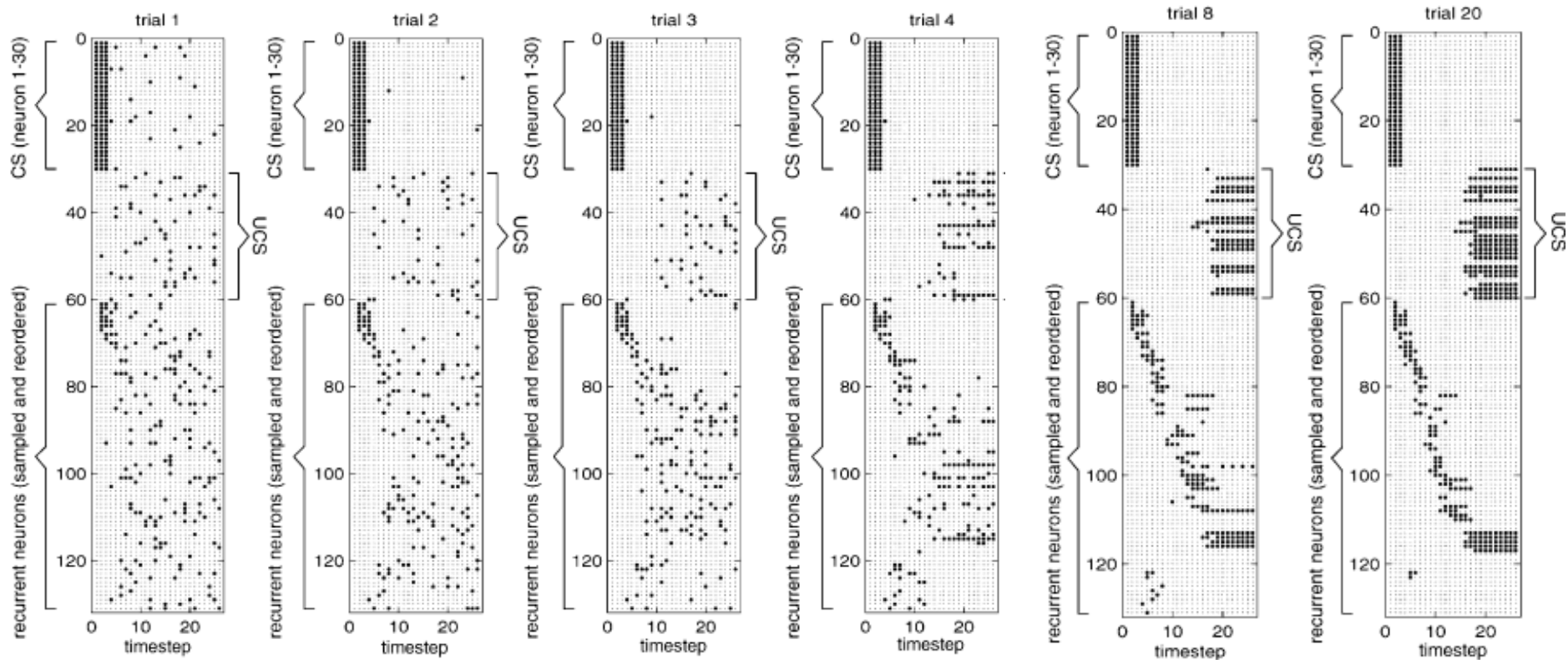
Model of network learning



Existing models: Levy et al. Biol. Cyb. 2005

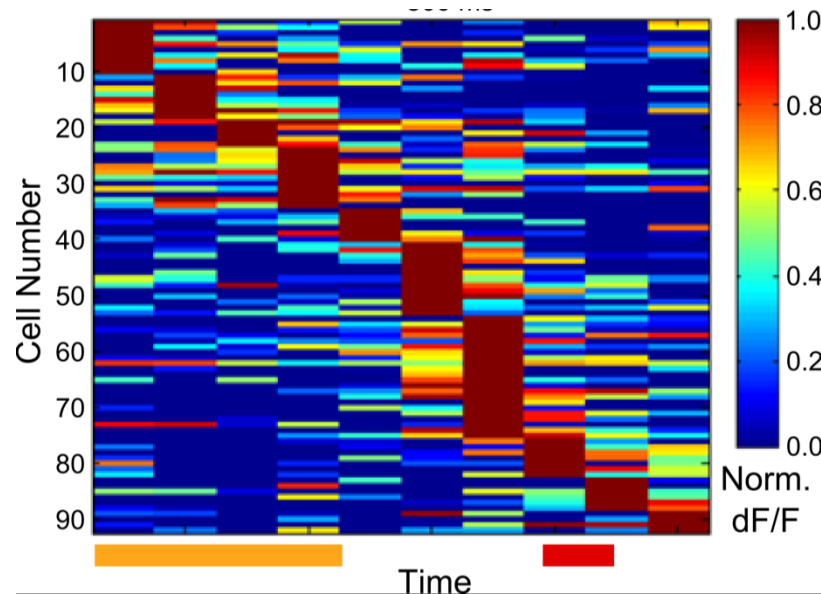


Existing models: Levy et al. Biol. Cyb. 2005



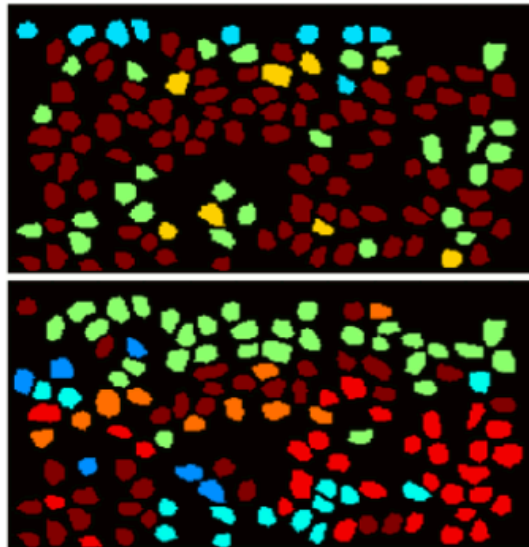
Questions on network learning

- What changes occur in activity?
- What changes occur in connectivity?
- What are the rules?
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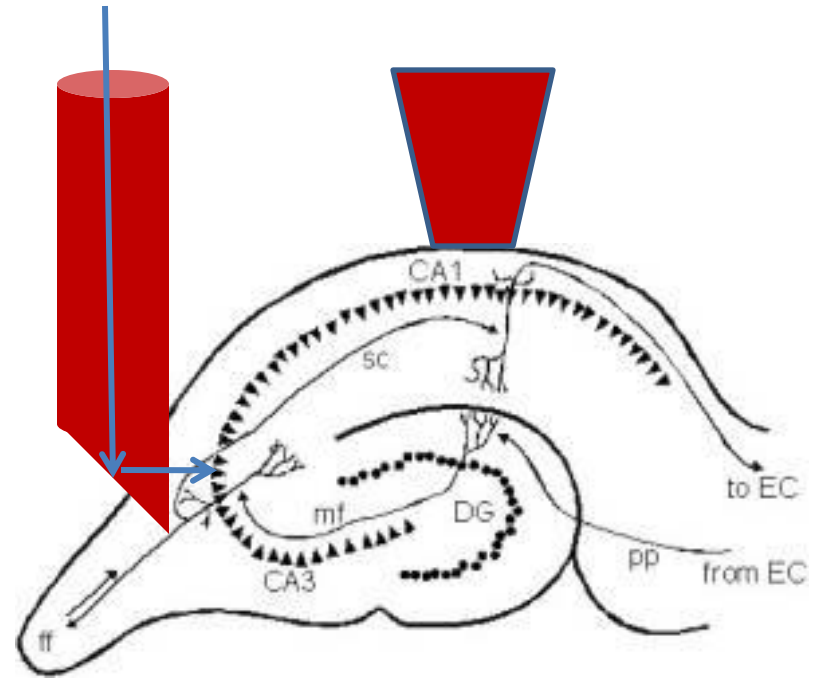
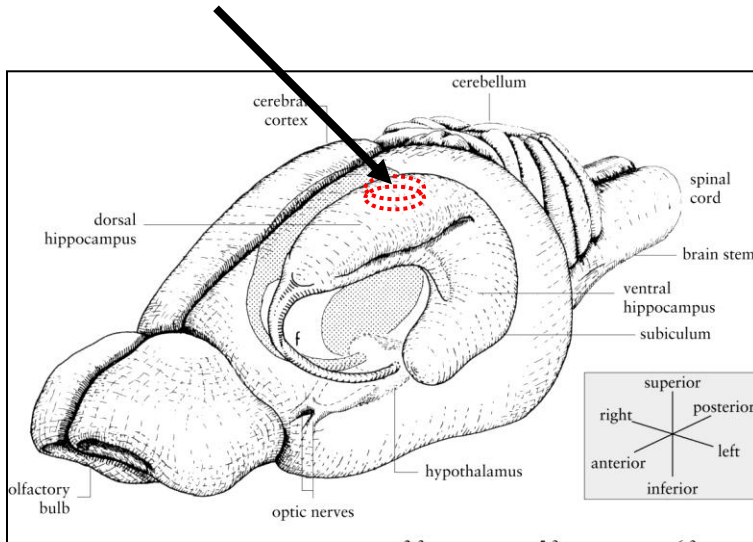


Questions on network learning

- What changes occur in activity?
- What changes occur in connectivity?
- What are the rules?
- How does multiscale signaling implement these rules?

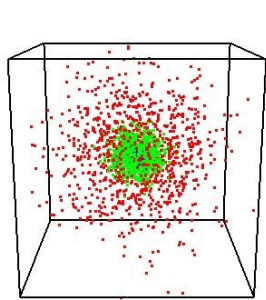


Where are the sequences generated?

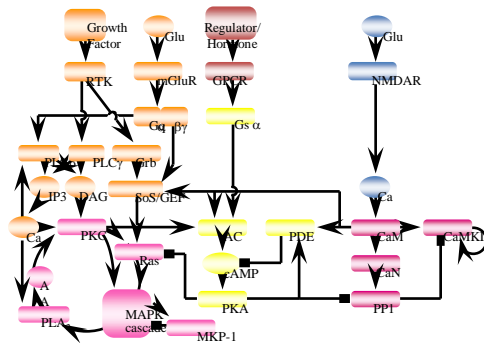


Questions on network learning

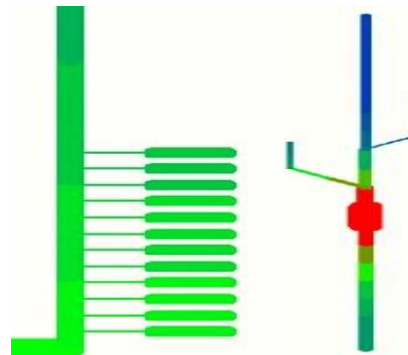
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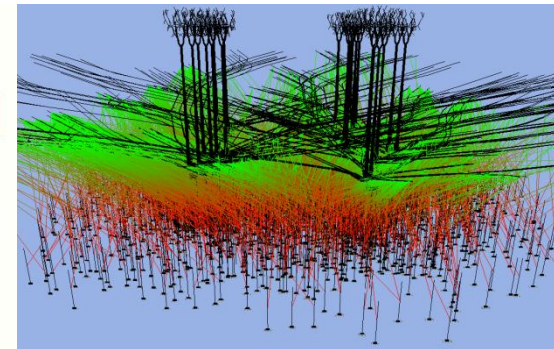
Molecules



Signaling networks



Cellular biophysics



Network

Thank you!



Mehrab Modi

Ashesh Dhawale

Imaging Facility, Mechanical and Electronics Workshops

Funding – DBT, NCBS/TIFR

