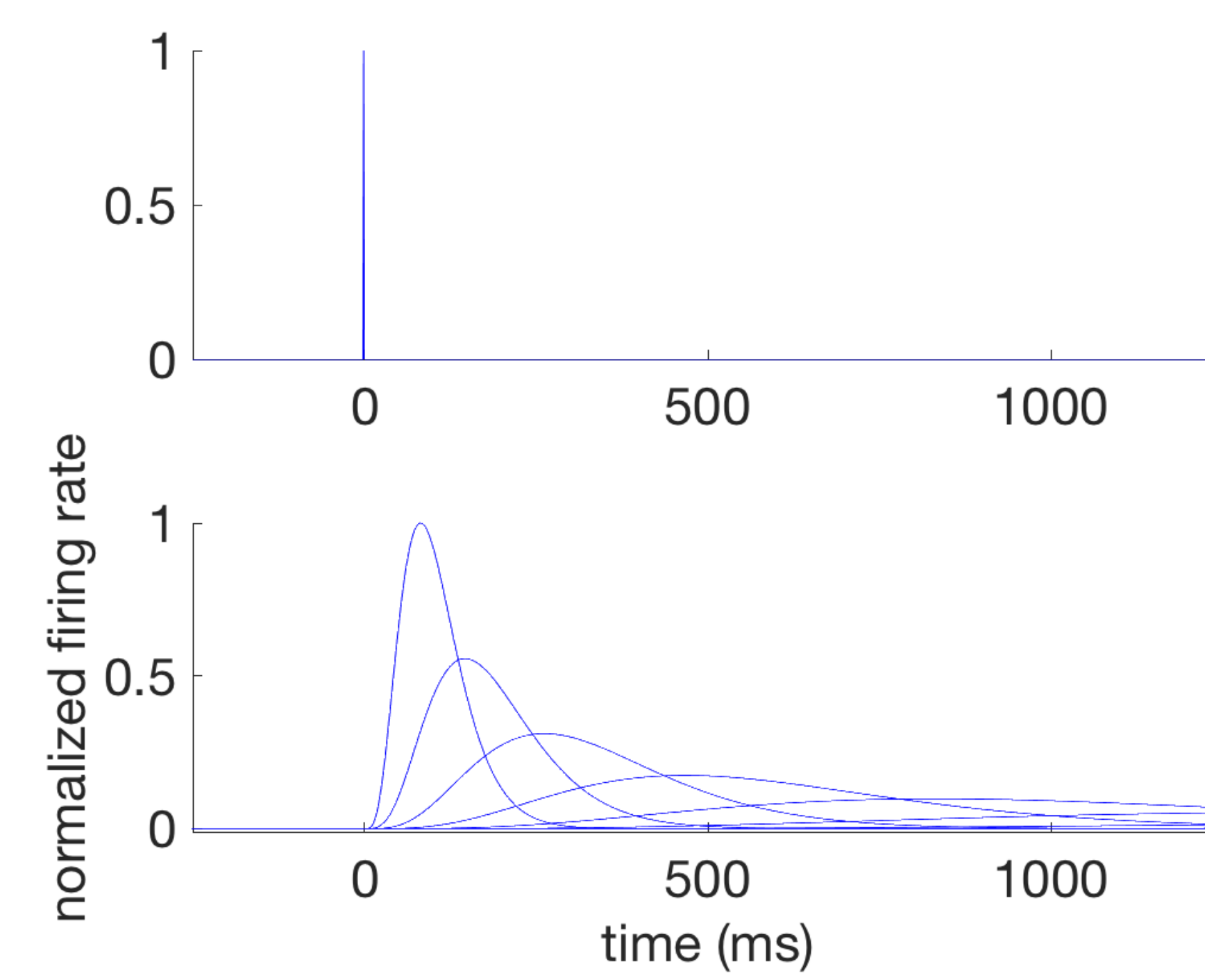


BACKGROUND

- Our model of memory depends on representations of a compressed temporal history
- Time cells could support such a representation
- Time cells have been extensively identified and characterized in rodent HPC
- We identify stimulus selective time cells in monkey PFC and HPC in a visual working memory paired associate task

IDEAL TIME CELLS^{2,3}

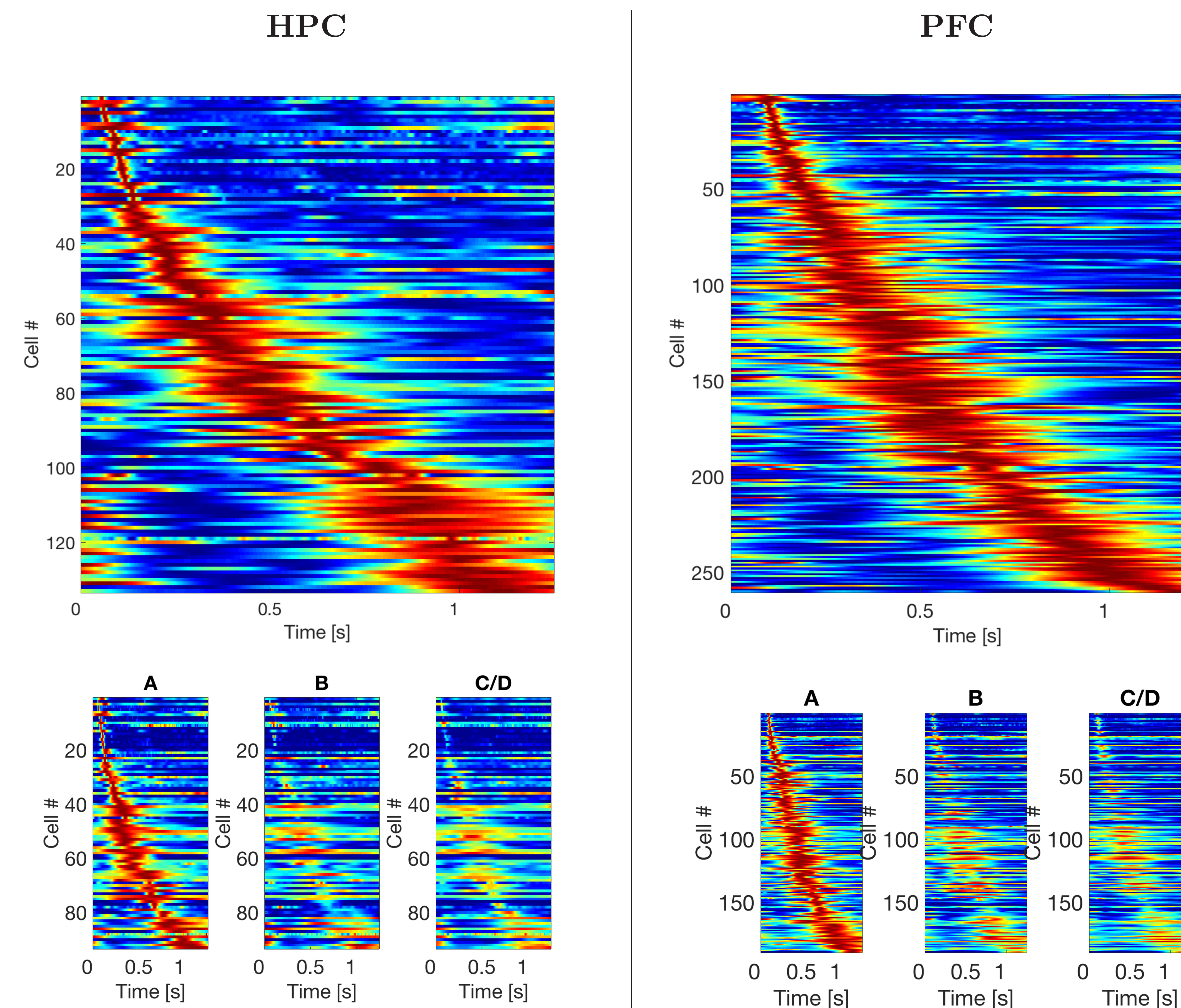


MODELING

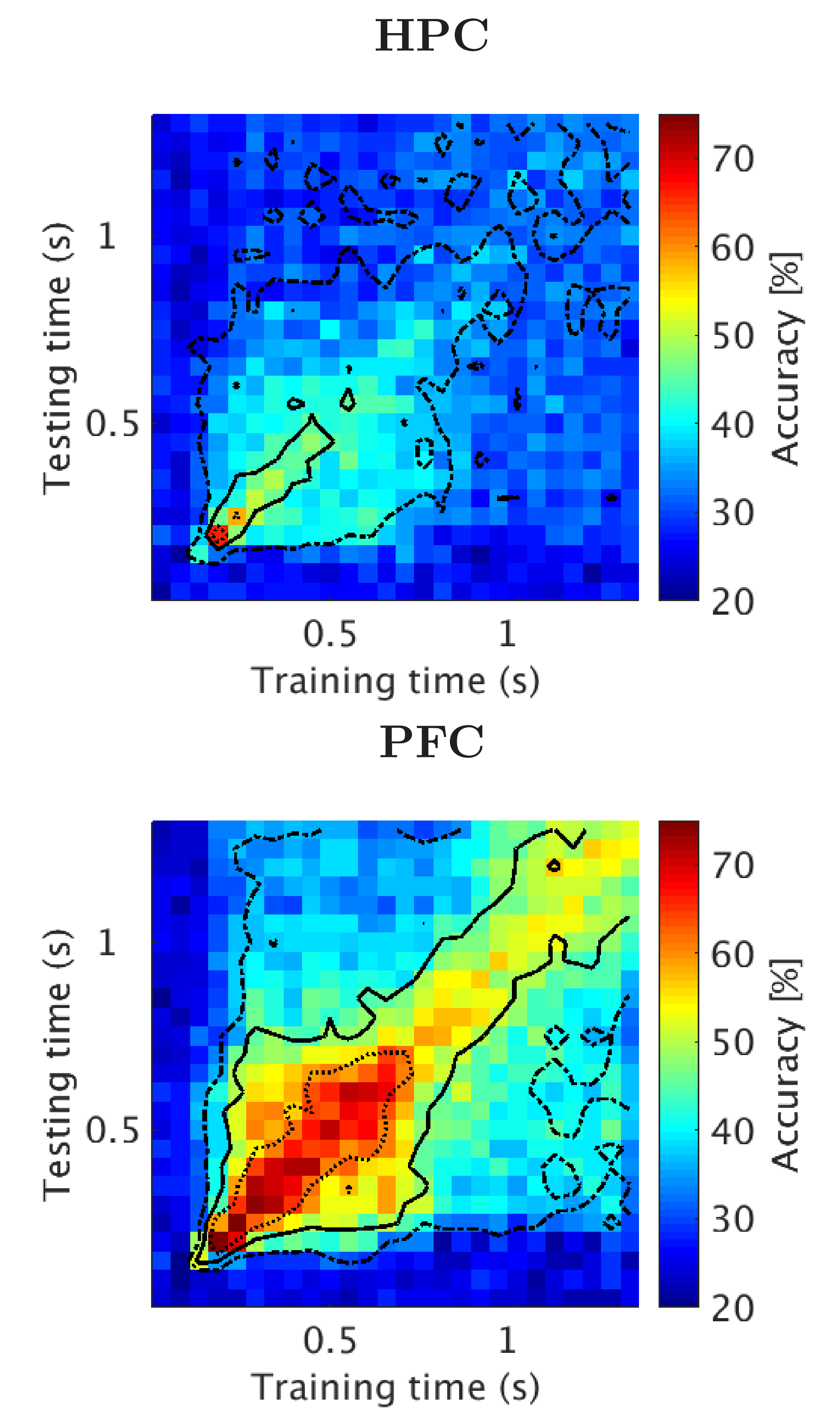
We used a maximum likelihood estimation with a Gaussian model of time cells.
 ML minimization: $\arg \min_{\Theta} nLL = -\sum_{\text{trial}} \sum_t [f_t \log(p(t; \Theta)) + (1 - f_t) \log(1 - p(t; \Theta))]$

Time Cell approximation: $T(t; \sigma_t, \mu_t) = e^{-\frac{(t-\mu_t)^2}{2\sigma_t^2}}$
 Constant Model: $p(t; \Theta) = a_0$
 Time Cell Model: $p(t; \Theta) = a_0 + a_1 T(t; \sigma_t, \mu_t)$
 Stimulus Specific Model: $p(t; \Theta) = a_0 + \sum_{i=1}^4 a_i c_i T(t; \sigma_t, \mu_t)$
 Paired Stimuli: $p(t; \Theta) = a_0 + \sum_{i=1}^2 a_i c_i T(t; \sigma_t, \mu_t)$

HPC AND PFC SHOW A TEMPORAL HISTORY

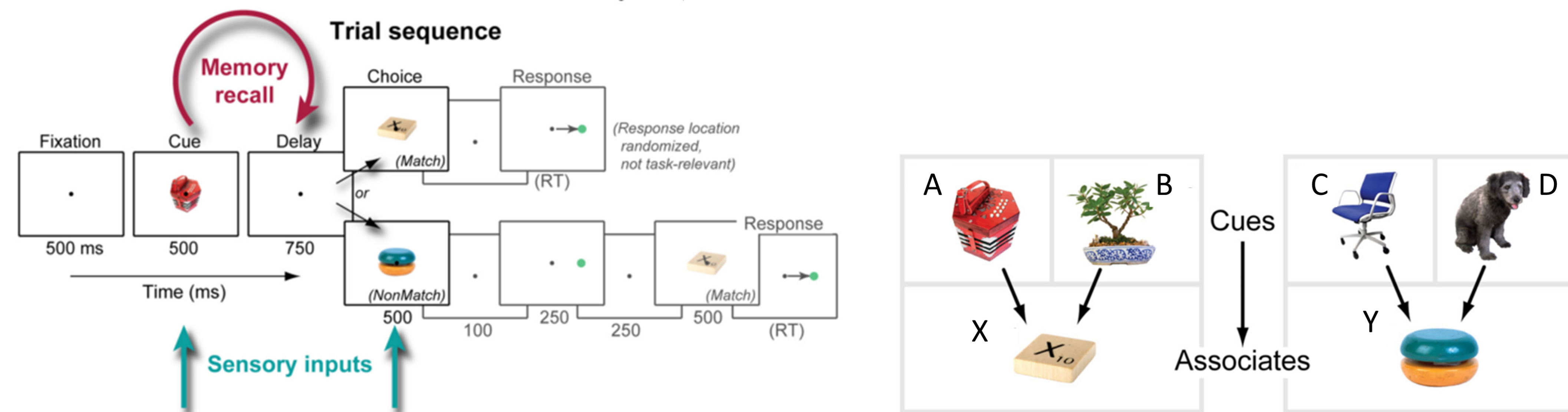


LDA

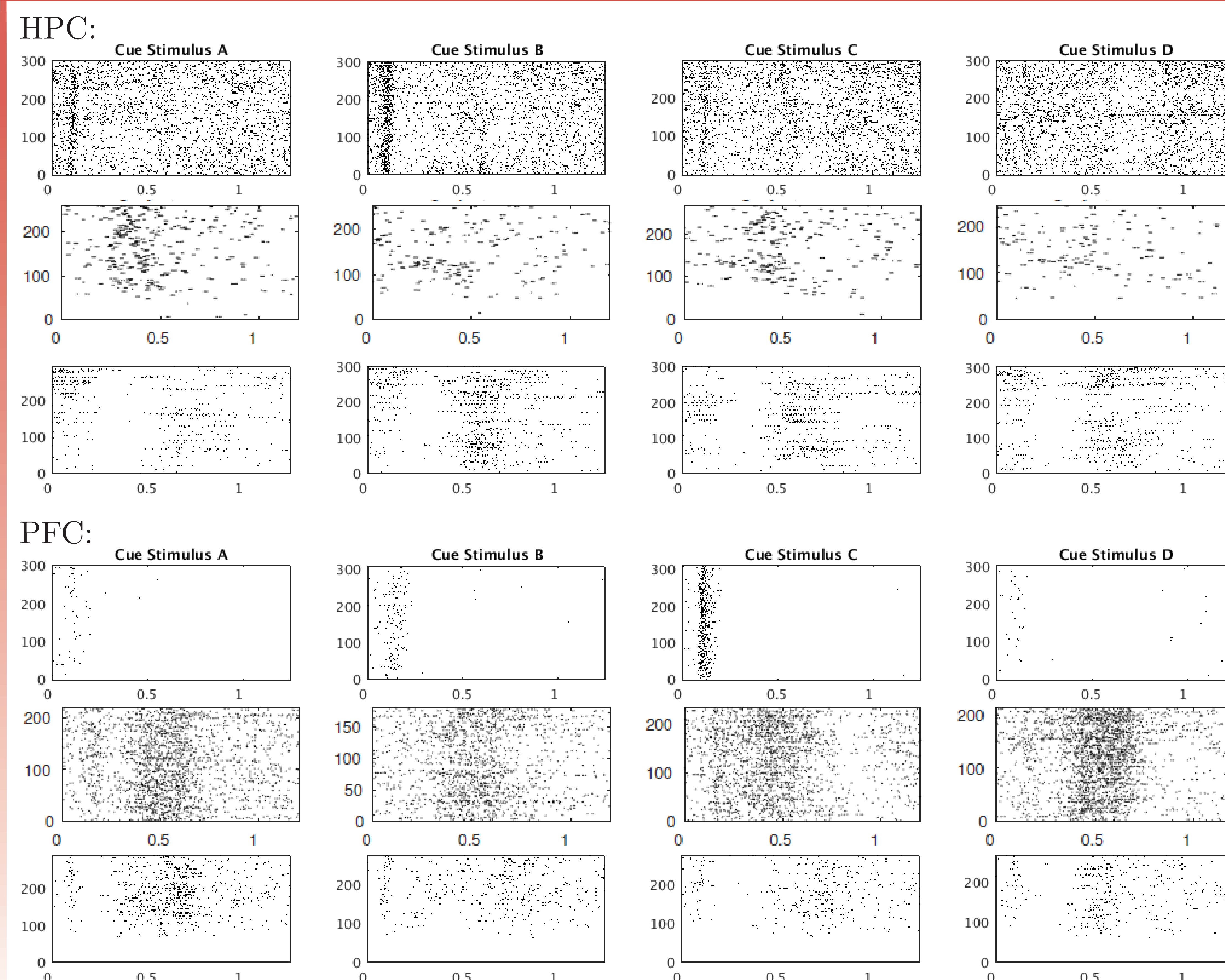


EXPERIMENT USED VISUAL STIMULI¹

This experiment featured a paired associate learning task with a 1.25 second delay between initial stimulus presentation and the associate stimuli.

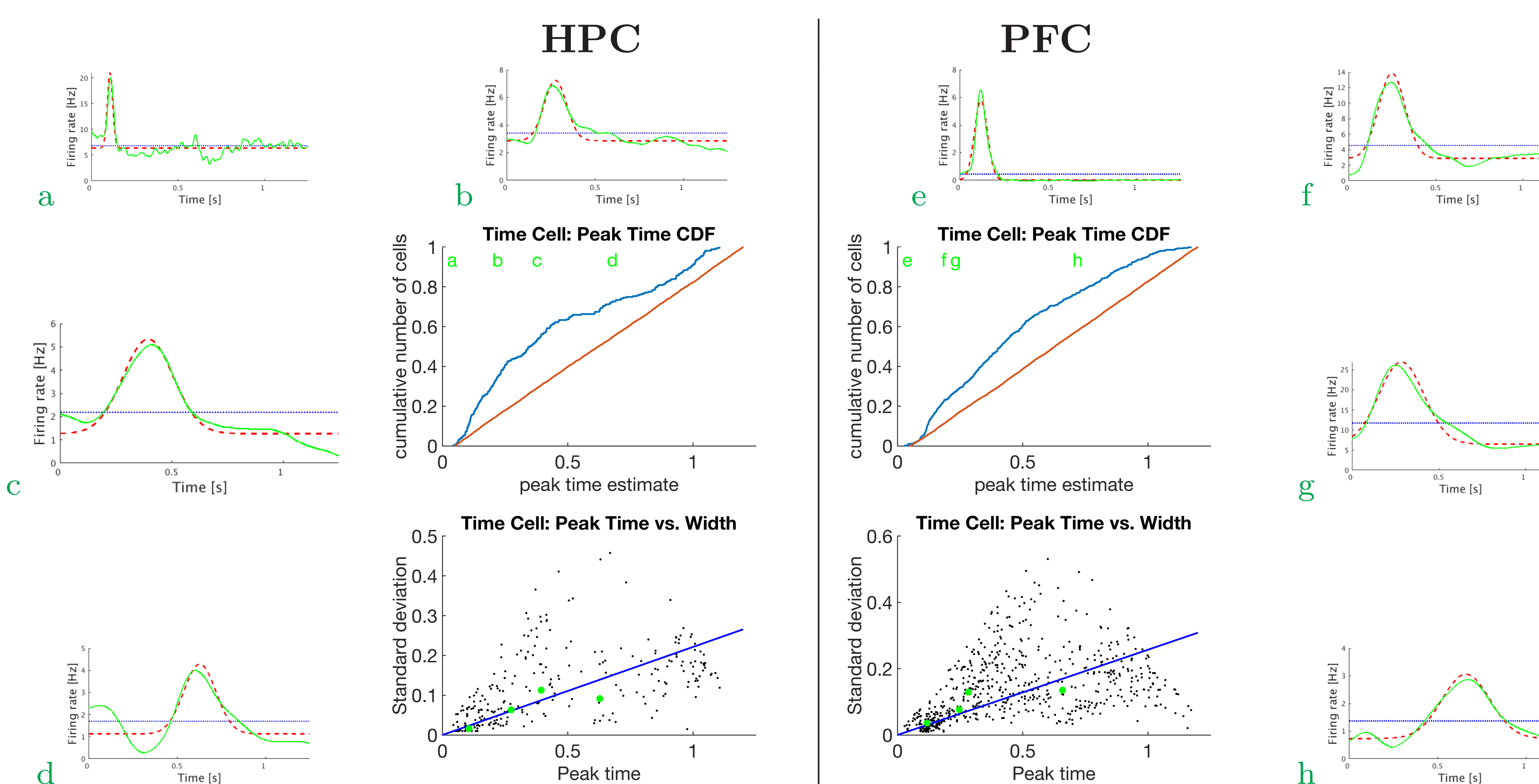


EXAMPLE TIME CELLS



The time cells are stimulus selective, but not selective for predictive categories.

TEMPORAL HISTORY IS COMPRESSED



RESULTS

These time cells

- Exist in both PFC and HPC
- Encode Visual Stimulus Identity
- Are organized into a compressed representation
- Code for past, not future

REFERENCES

[1] Scott L. Brincat, and Earl K. Miller. *Frequency-specific hippocampal-prefrontal interactions during associative learning.* Nature neuroscience 18.4 (2015): 576-581.
 [2] K. H. Shankar and M. W. Howard. *A scale-invariant representation of time.* Neural Computation, 2012.
 [3] Zoran Tiganj, Jason A Cromer, Jefferson E Roy, Earl K Miller, Marc W Howard. *Compressed timeline of recent experience in monkey LPFC.* bioRxiv, 2017

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