# The contribution of response correlations to the neural code of V1

1) Computational Systems Neuroscience Lab, MTA Wigner Research Centre for Physics, Budapest, Hungary 2) Ernst Strüngmann Institute for Neuroscience in Cooperation with Max Planck Society, Frankfurt, Germany

#### Stimulus content shapes correlations

- vision is understood as inference in a hierarchical probabilistic model of natural stimuli
- perception of latent features in an observed stimulus is implemented as the representation of the posterior distribution of the feature
- the shape of the posterior distribution depends on both the stimulus and the inferred higher-level features



- V1 simple cells represent oriented edge features, while extrastriatal neurons represent complex visual features
- neural activity correlations in V1 are predicted to differ more when the inferred higher-level content of the stimuli are different



### **Experimental paradigm**

- electrode arrays in the V1 of two macaques
- multiunit spike trains
- task-engaged animals: attention task
- task design for reliable correlation assessment: 6/8 stimuli, 13 sessions, 600-1000 trials





Mihály Bányai<sup>1</sup>, Marcell Stippinger<sup>1</sup>, Dávid Szalai<sup>1</sup>, Andreea Lazar<sup>2</sup>, Liane Klein<sup>2</sup>, Johanna Klon-Lipok<sup>2</sup>, Wolf Singer<sup>2</sup>, Gergő Orbán<sup>1</sup>

#### Stimulus-dependence of correlations

In order to assess the stimulus-specificity of detailed correlation patterns, the dissimilarity of spike count correlations (SCC) are assessed

- across stimuli
- within stimulus, variation due to finite sample size



#### **Contrastive rate matching**

- changes in firing rate might confound the measurement of the magnitude of SCCs such that stimulus-specific of firing rates might cause stimulus-specificity in SCCs
- matching the distribution of rates via subsampling the data controls for this confound



- simulated spike trains are used to assess the effectiveness of CRM
- in different conditions we can individually control for changes in firing rates and correlations



Distribution matching removes mean-related SCC effects from simulated spike trains, but not top-down effects.

### **Correlation specificity modulation**

Synthetic images that consist of different oriented edges but do not have any higher-order statistical structure (LL-synthetic) are compared to natural images.



SCCs differ more in response to natural stimuli than to LL-synthetic stimuli, as predicted by the hierarchical inference model.

#### **Role of correlations in decoding**

- logistic regression on z-scored data
- linear and quadratic mixture of Gaussian decoders



## **Probing intermediate representations**

- Stimuli from independent oriented edges (LL)
- Synthetic stimuli with correlations between the oriented edges derived from texture patterns, shown to elicit differential response in V2.



SCCs differ more in response to HL-synthetic than to LL-synthetic stimuli, suggesting that second-order texture statistics are represented in the visual cortex as latent variables.



### Affine model





spike train

- Phenomenological models with additive and multiplicative terms do not reproduce the content modulation of SCC specificity
- Augmenting the affine model with stimulus-specific coupling reintroduces the modulation







### **Raster marginal model**

- The raster marginal model (RMM) generates SCCs based on the finite number of bins used to compute them
- Measured SCC specificities in response to natural images are very unlikely under the RMM







### Conclusions

- the hierarchical inference model of perception predicts the stimulus-dependence of population activity statistics (correlations)
- the stimulus-specificity of correlations depends on stimulus structure: it is attenuated for stimuli lacking high-level structure
- specific correlation patterns in V1 support a sampling-based neural representation

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