



Binocular integration as nonlinear mixing: how binocular neurons in primary visual cortex preserve eye-specific information for downstream visual processing

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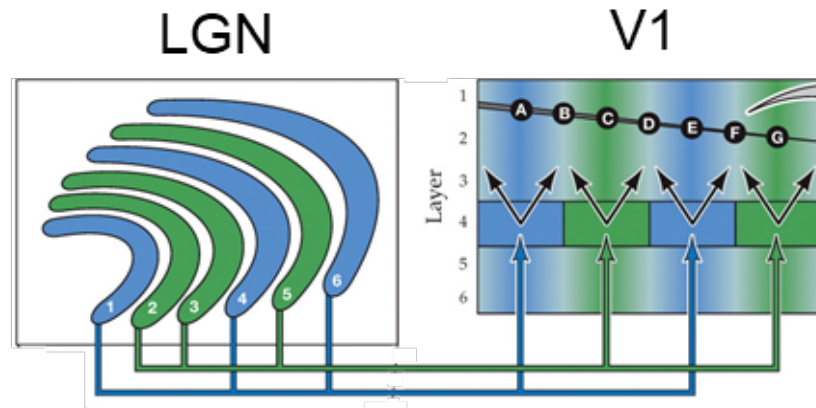
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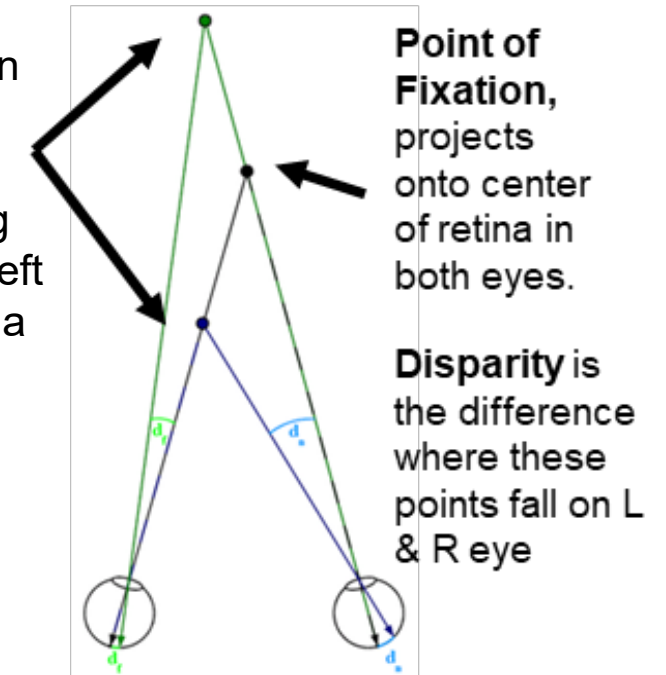
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Binocular integration occurs in primary visual cortex, and is believed to involve disparity information



From Purves et al. Neuroscience

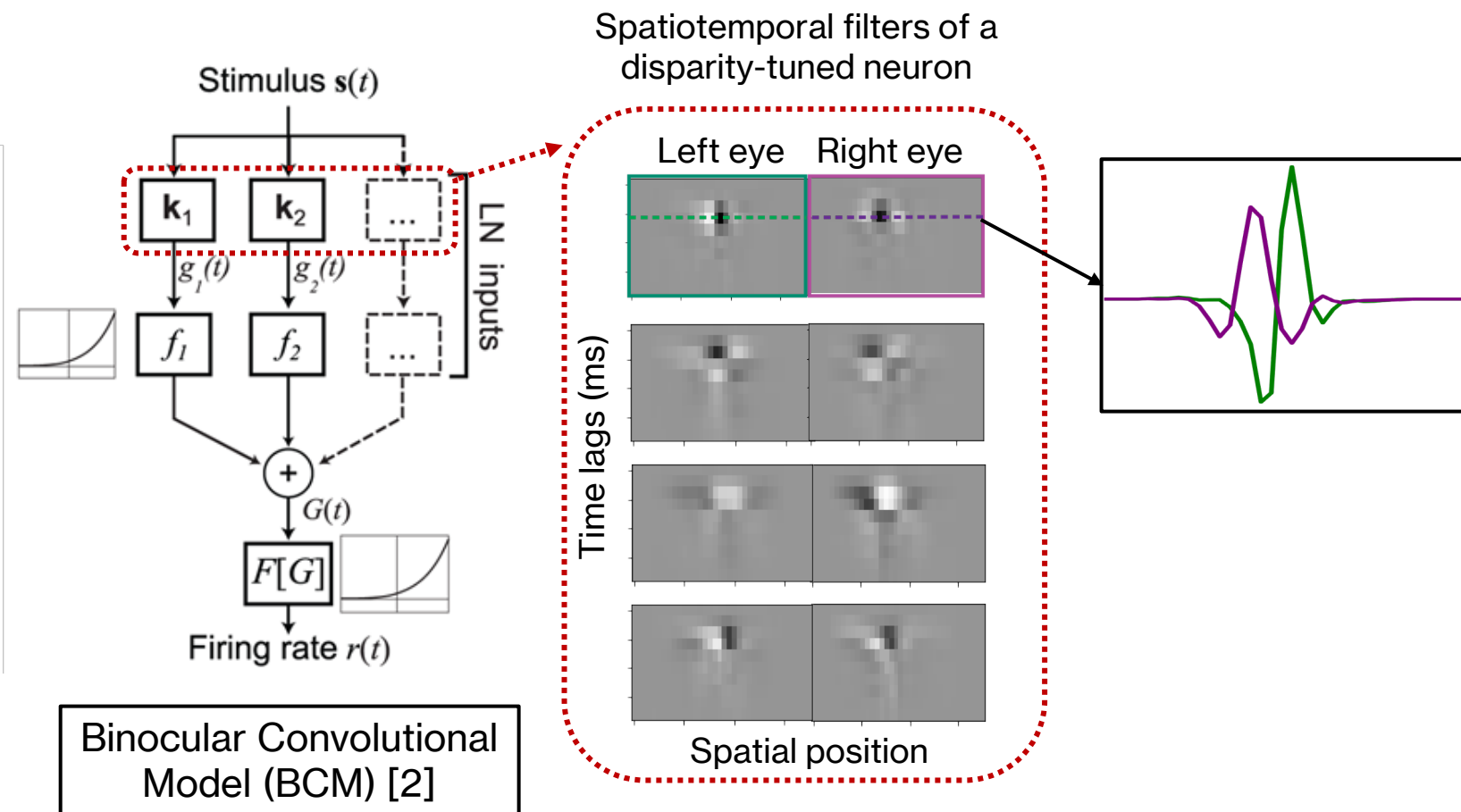
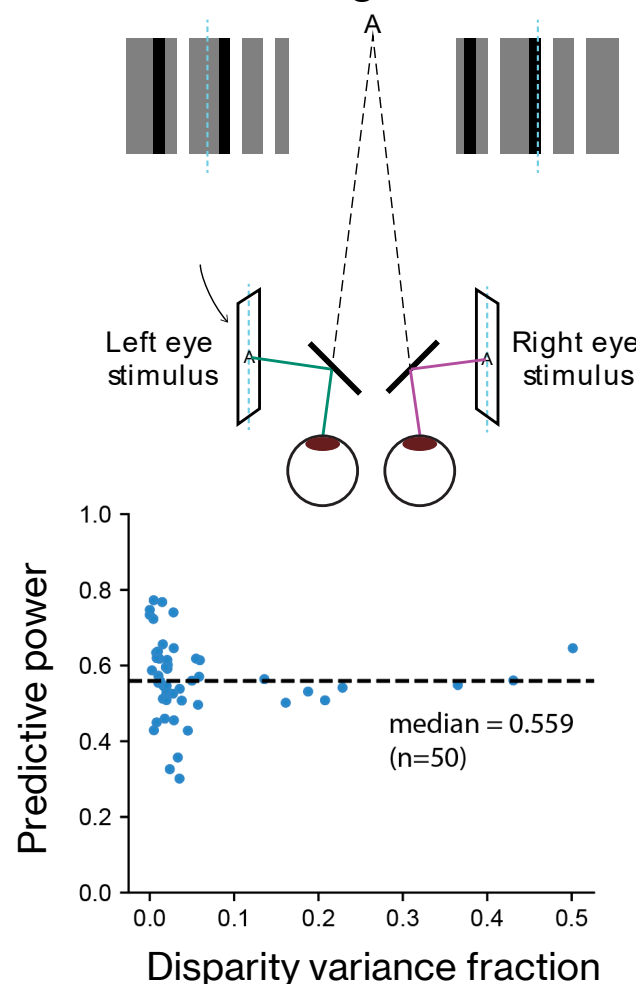
Other points in visual space **don't project** onto matching points of the left and right retina



How can information from both eyes be meaningfully combined without sensitivity to binocular disparity?

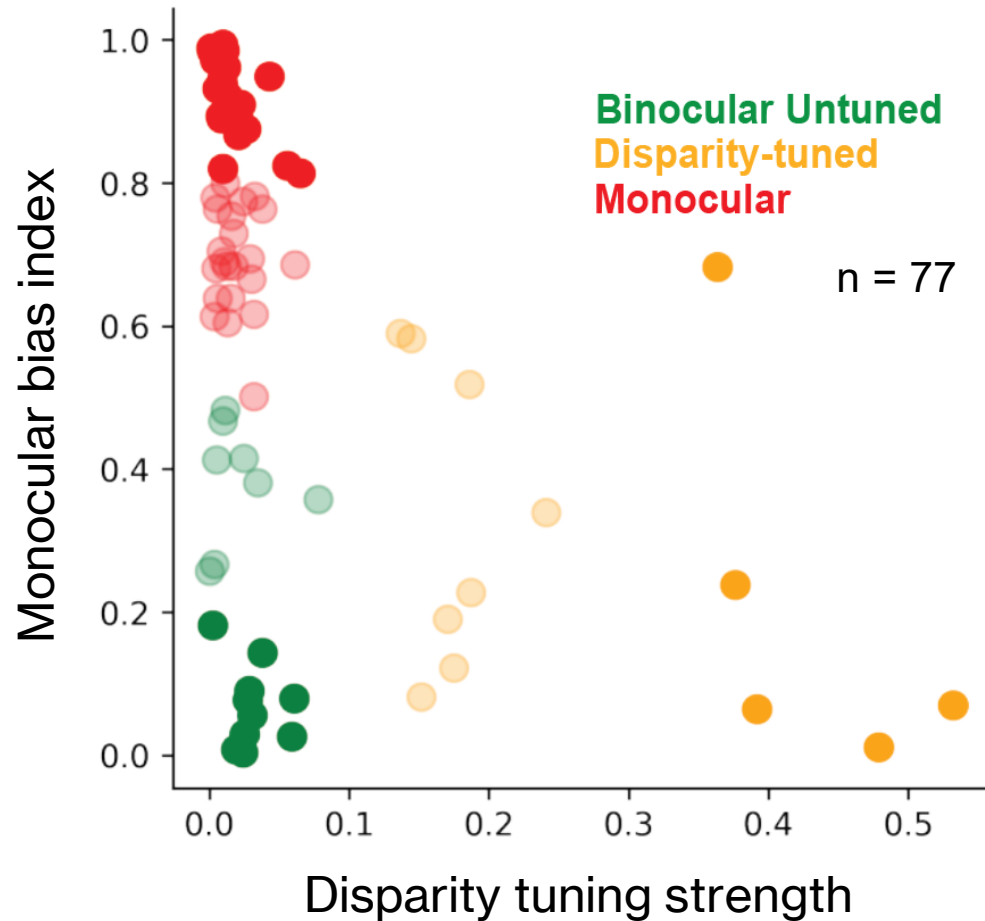
We can run simulations with well-fit binocular convolutional models to understand these V1 neurons

Based on data from Bruce Cumming (NIH) [1]



See SFN 2021 Poster Presentation P479.06

Only a fraction of binocular neurons in V1 are selective to disparity

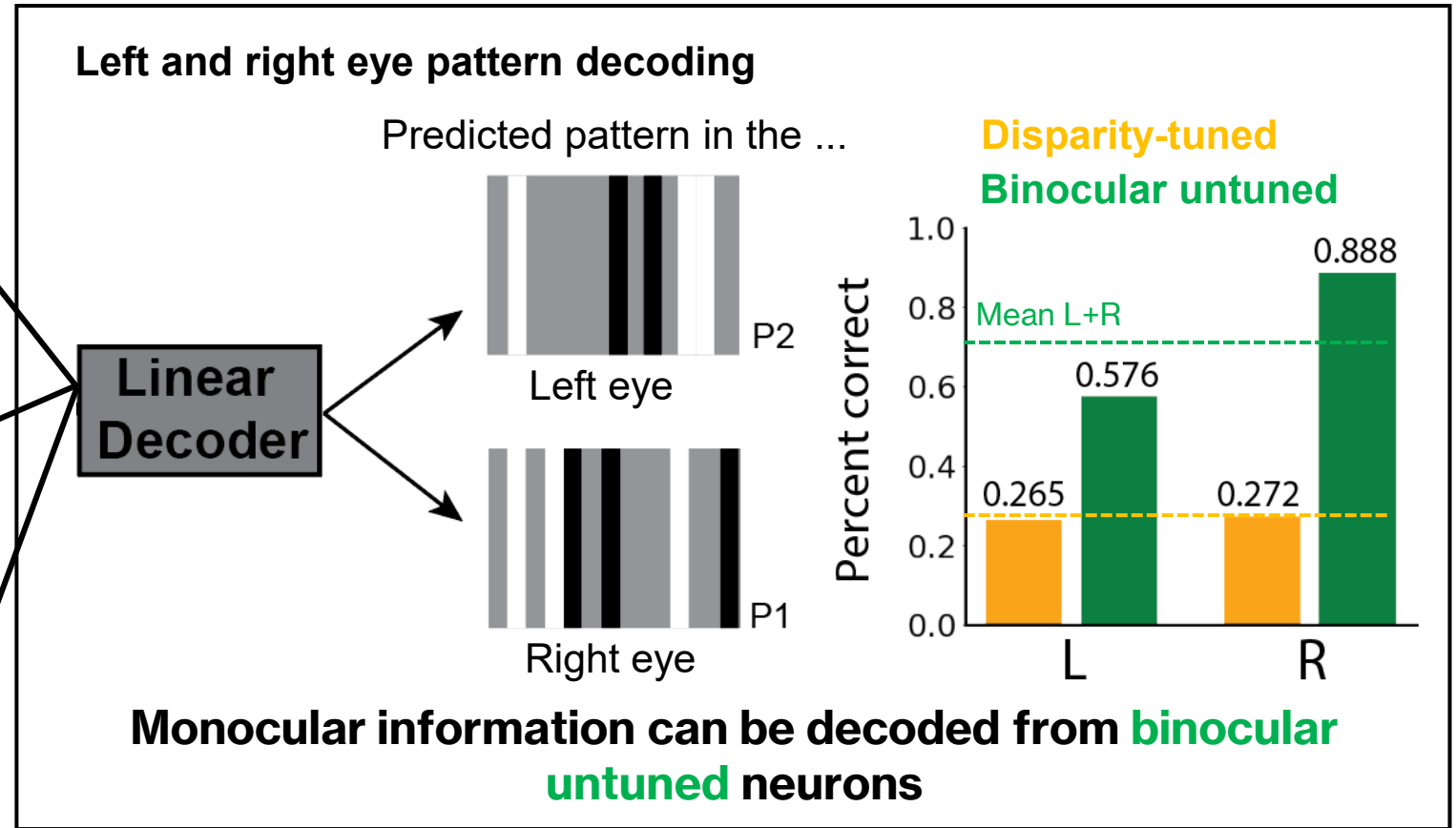
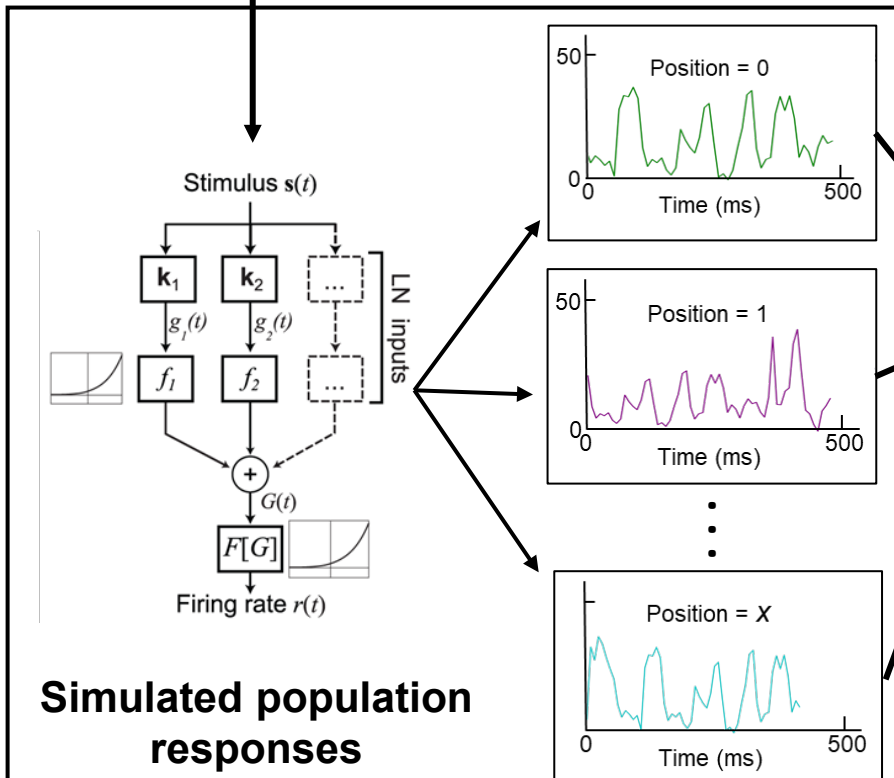
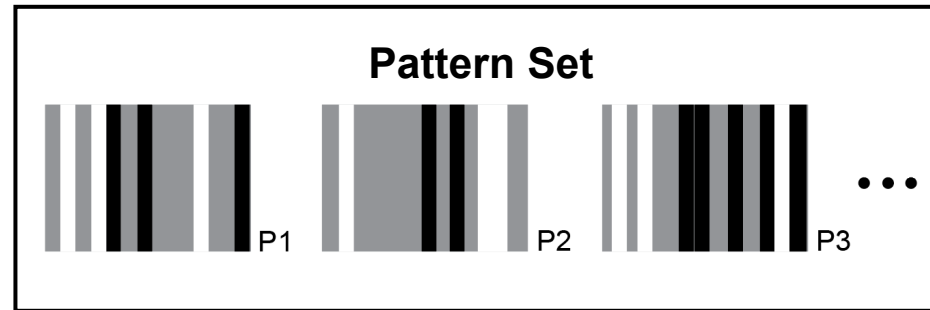
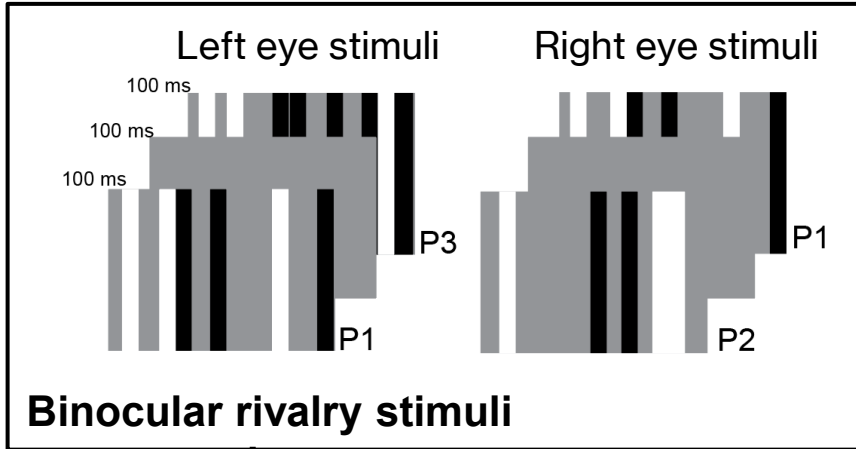


Hypothesis: Monocular information (i.e., info about the image in a specific eye) is carried by binocular neurons that are not tuned to disparity (“**binocular untuned**” neurons) and can be decoded at the population level [3].

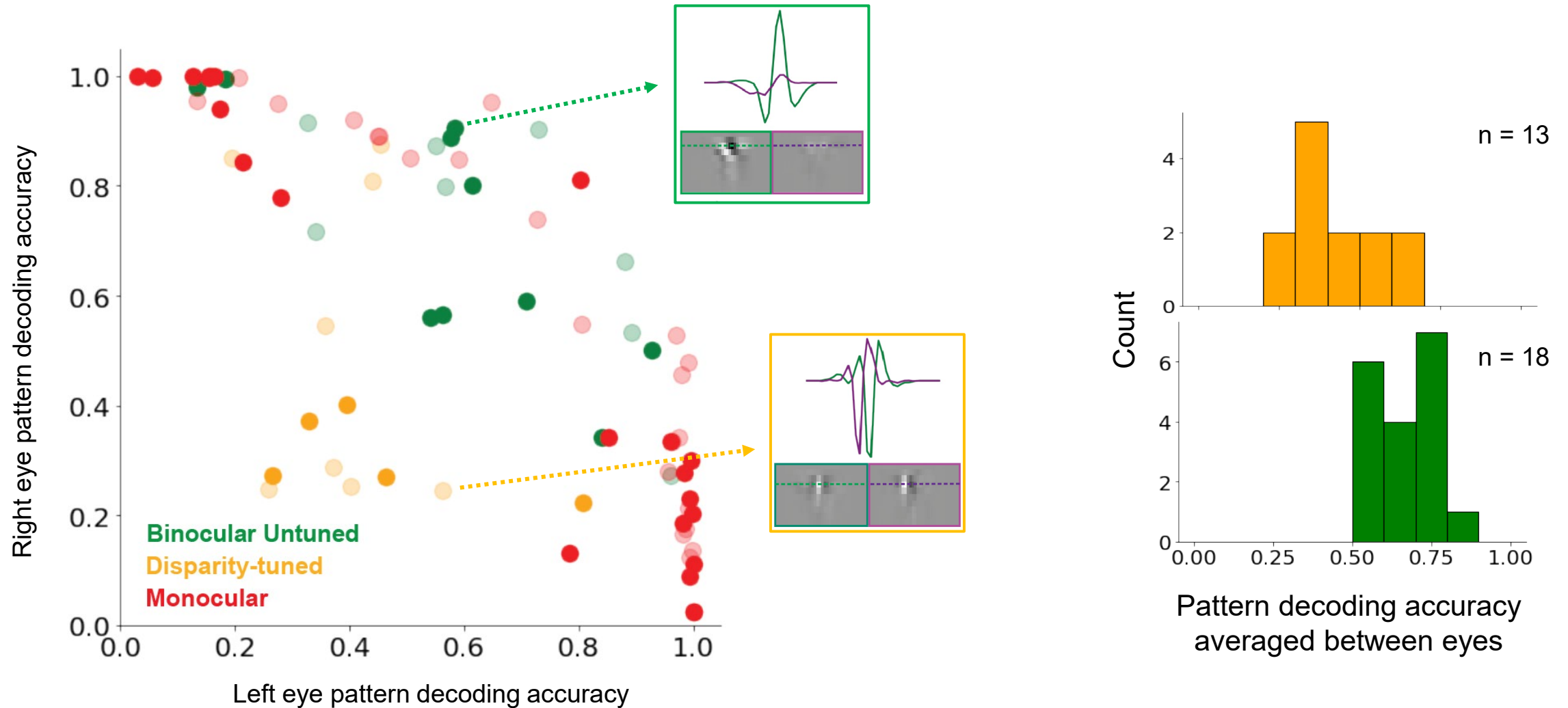
Corollary: Binocular integration generally occurs through nonlinear mixing [4], which will also facilitate more sophisticated computations in depth [5-7]

$$\text{Monocular Bias Index} = \text{abs} \left(\frac{\text{var}(R_R) - \text{var}(R_L)}{\text{var}(R_R) + \text{var}(R_L)} \right)$$

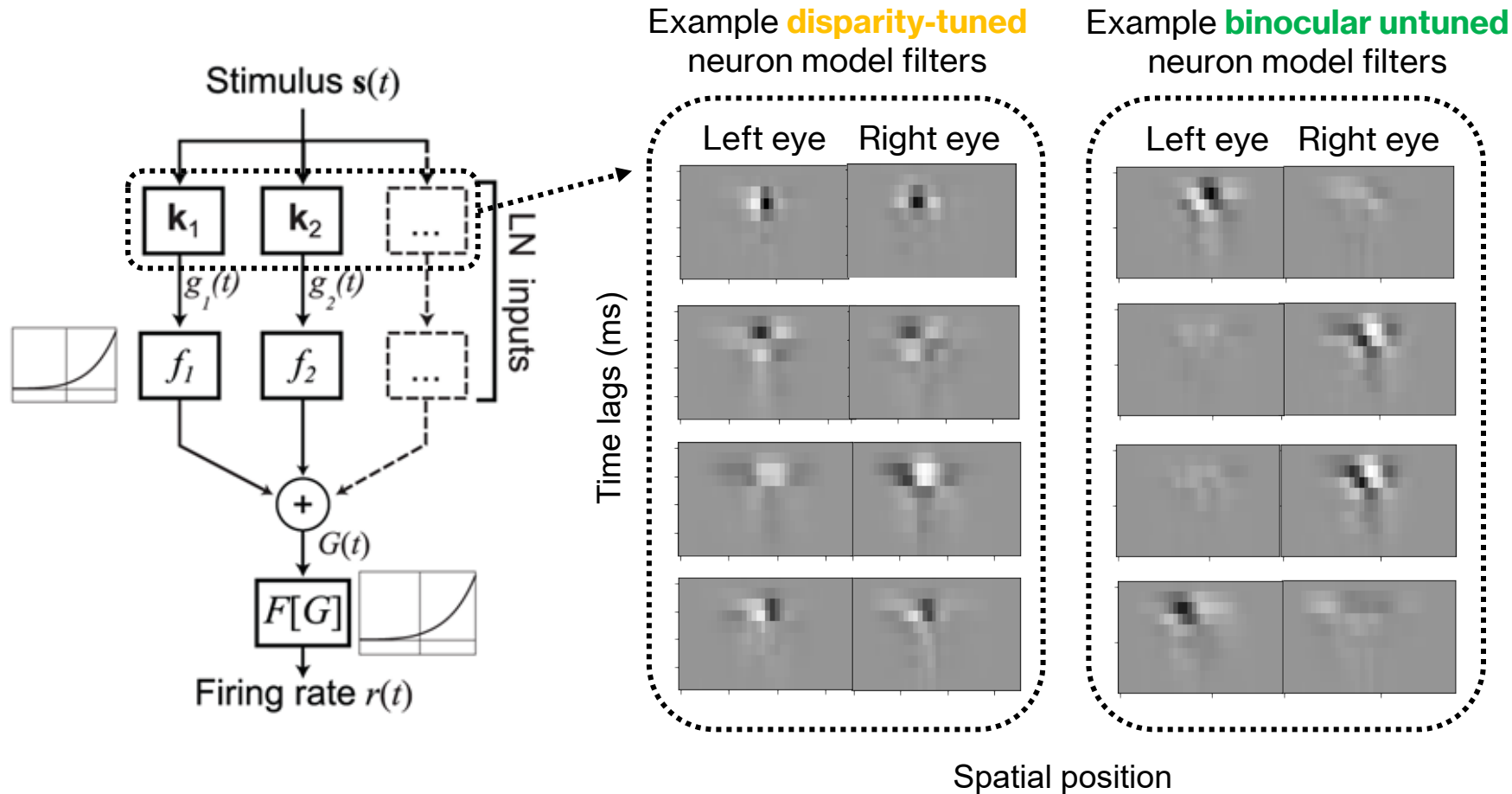
Binocular rivalry simulation



Binocular untuned neurons encode more monocular information than disparity-tuned neurons



Binocular untuned neurons nonlinearly mix left and right eye information



$$f(\mathbf{k}_L \cdot \mathbf{s}_L + \mathbf{k}_R \cdot \mathbf{s}_R) \quad (1)$$

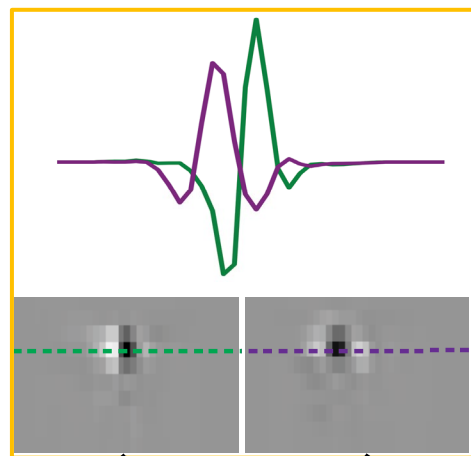
Disparity-tuned subunit:
linear combination of L & R
eye information

$$f(\mathbf{k}_L \cdot \mathbf{s}_L) + f(\mathbf{k}_R \cdot \mathbf{s}_R) \quad (2)$$

Binocular untuned:
nonlinear mixing of L & R
eye information

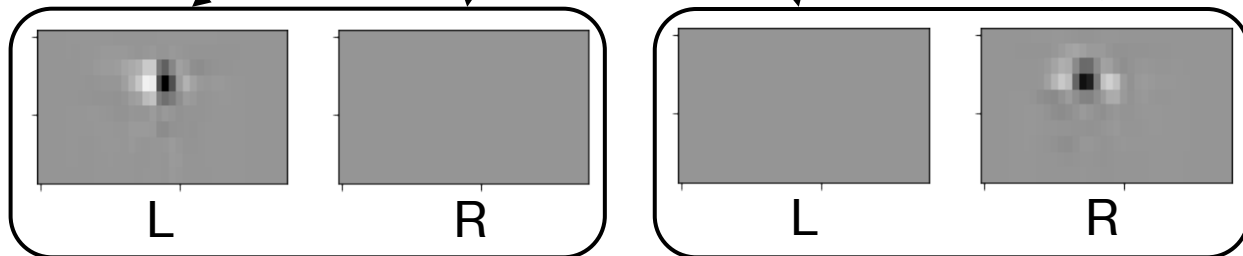
Converting disparity-tuned neurons into binocular untuned neurons rescues monocular information

Sample **disparity-tuned neuron** model filters

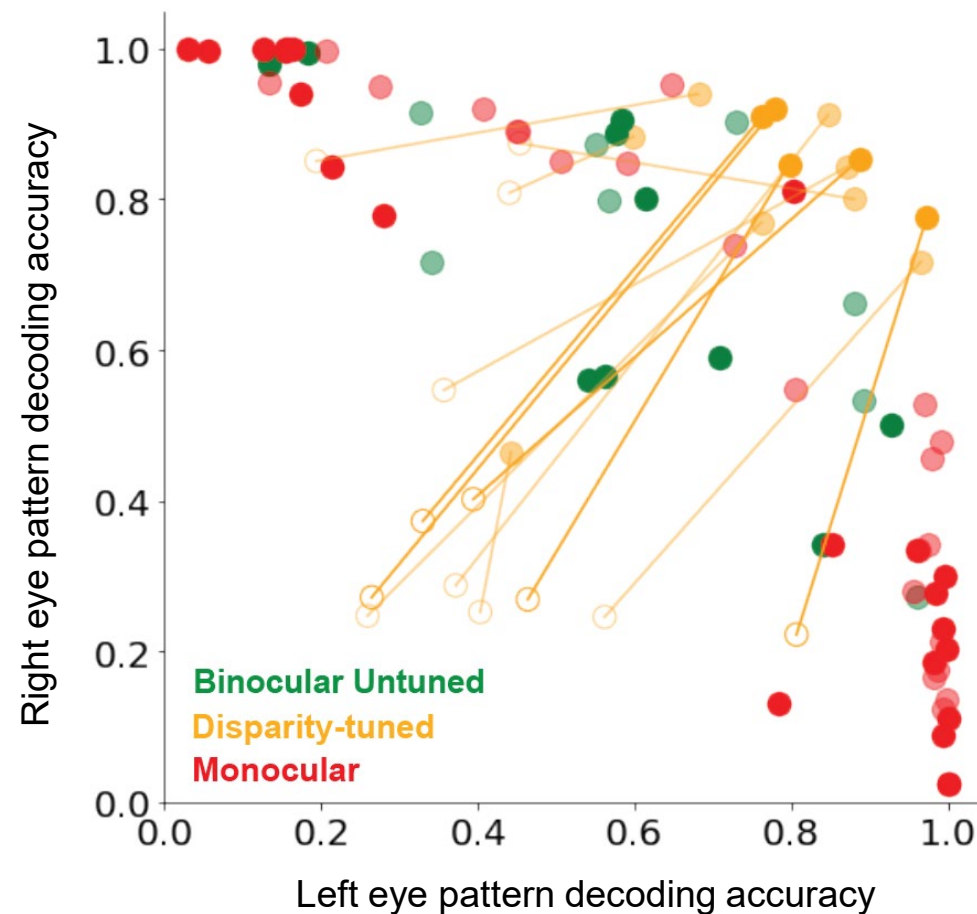


Linearly combine L & R eye information

Nonlinearly mix L and R eye information



Nonlinear mixtures preserve information at population level



Conclusions

- Most V1 neurons are binocular but combine left and right eye information irrespective of binocular disparity.
- Binocular neurons that are insensitive to disparity (“binocular untuned” neurons) preserve eye-specific stimulus information and is extractable by population decoding; no separate eye channels are needed to preserve eye-specific information [3].
- Binocular untuned neurons represent “nonlinear mixtures” of left and right-eye information and may be used for flexible downstream decoding of more complex conjunctions of features [4], such as facilitating sensitivity to three-dimensional motion [5-7].

References

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