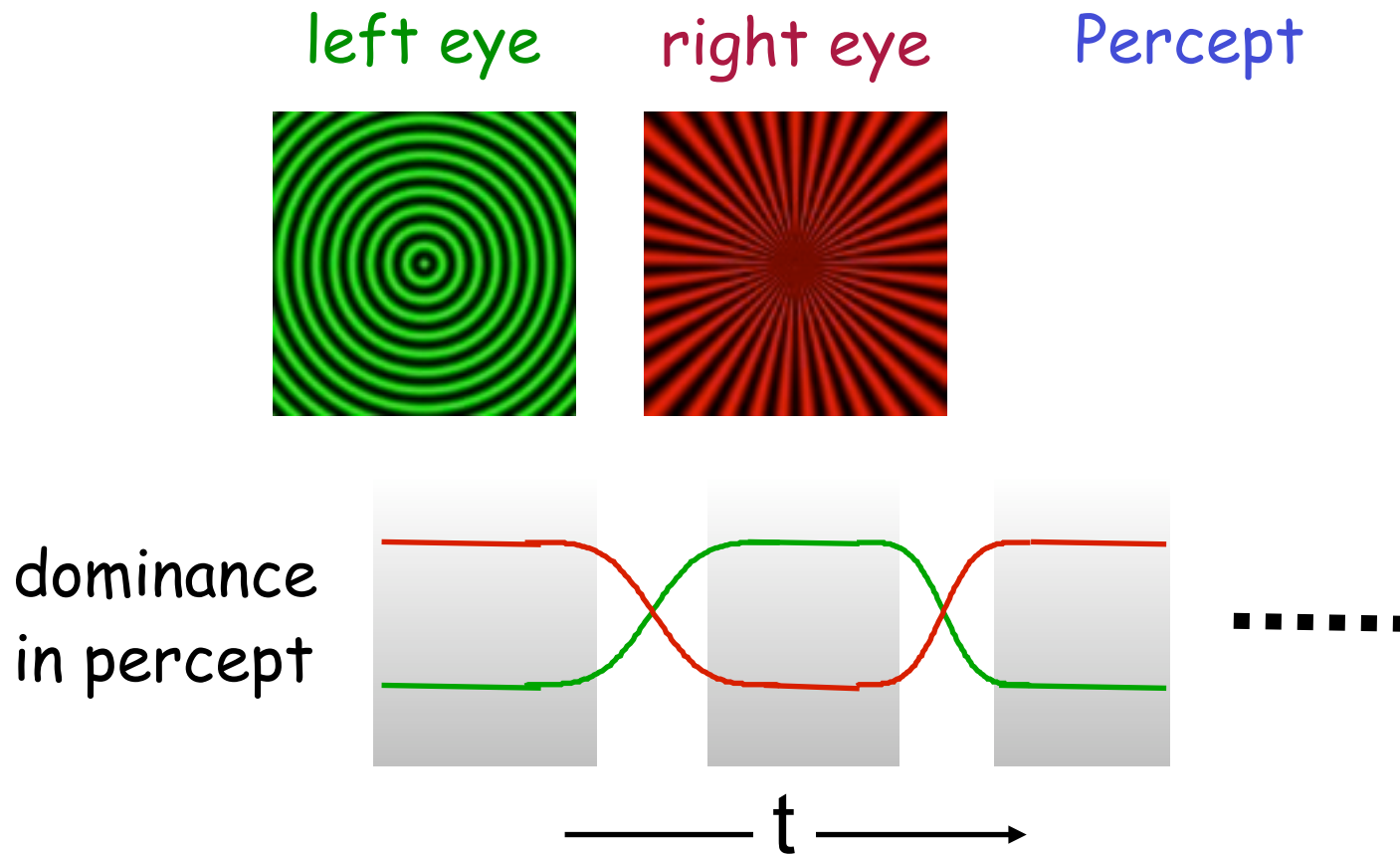


# Spatiotemporal dynamics of activity in human visual cortex

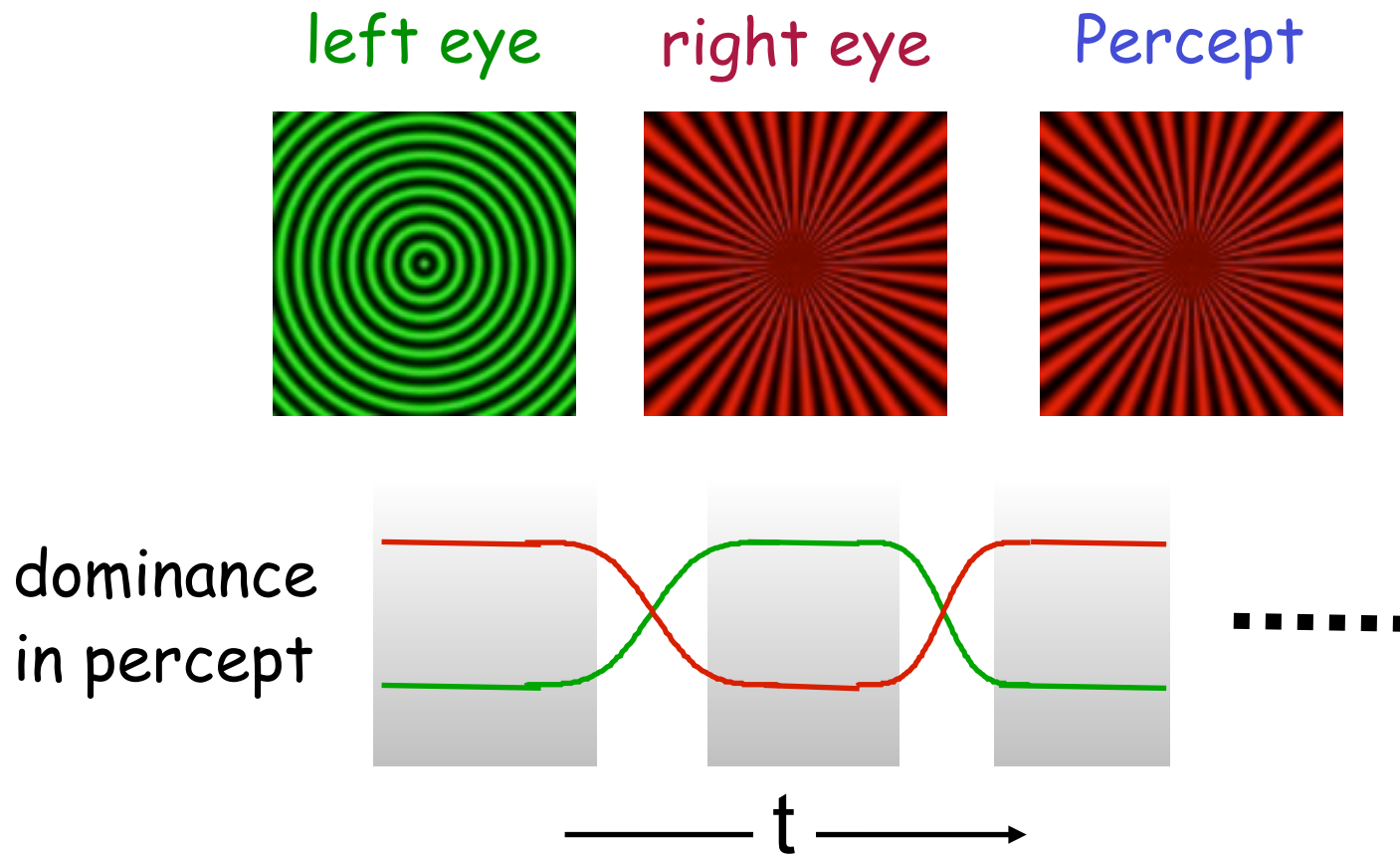


David J. Heeger  
New York University

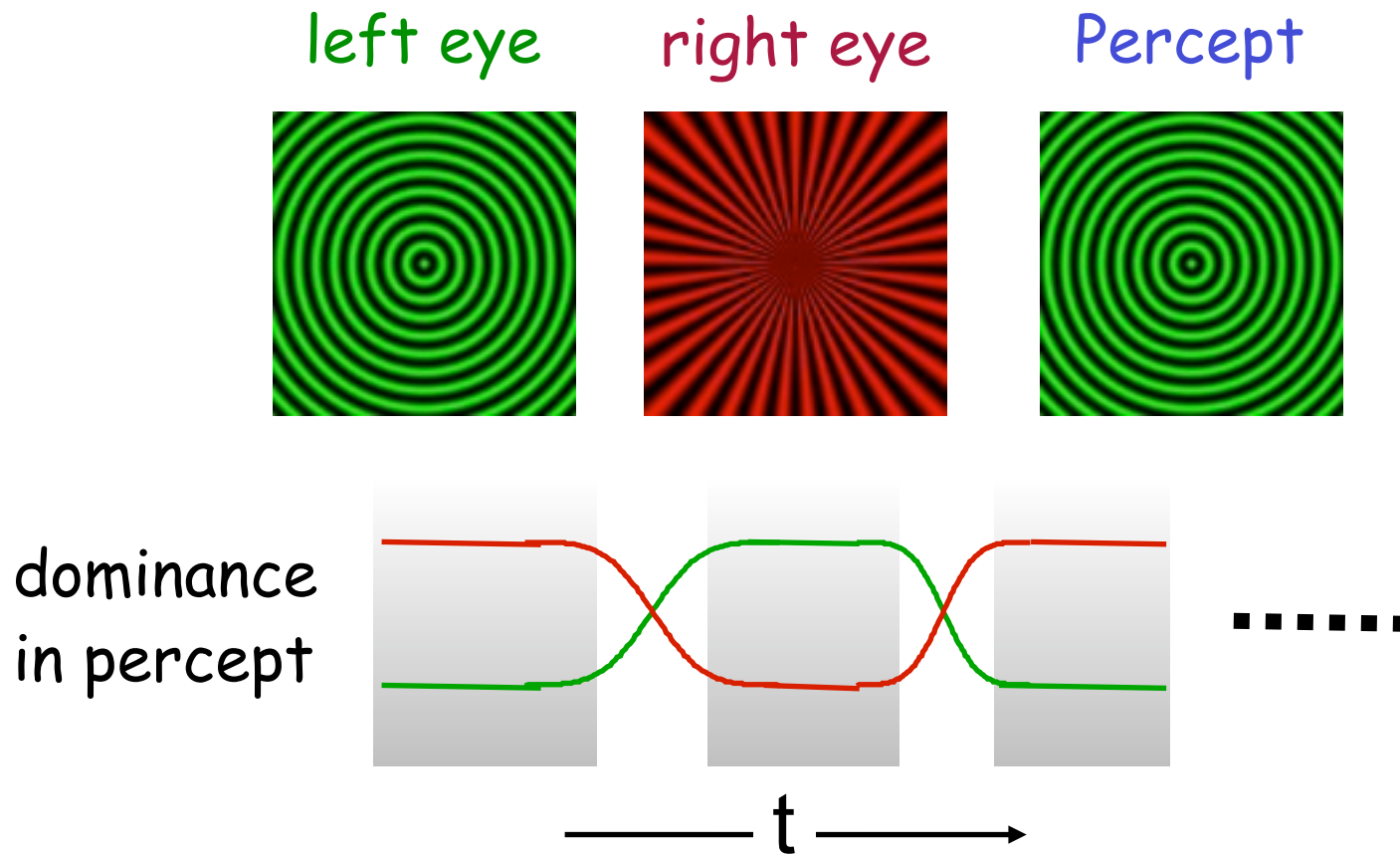
# Part I: Spatiotemporal dynamics during binocular rivalry



# Part I: Spatiotemporal dynamics during binocular rivalry

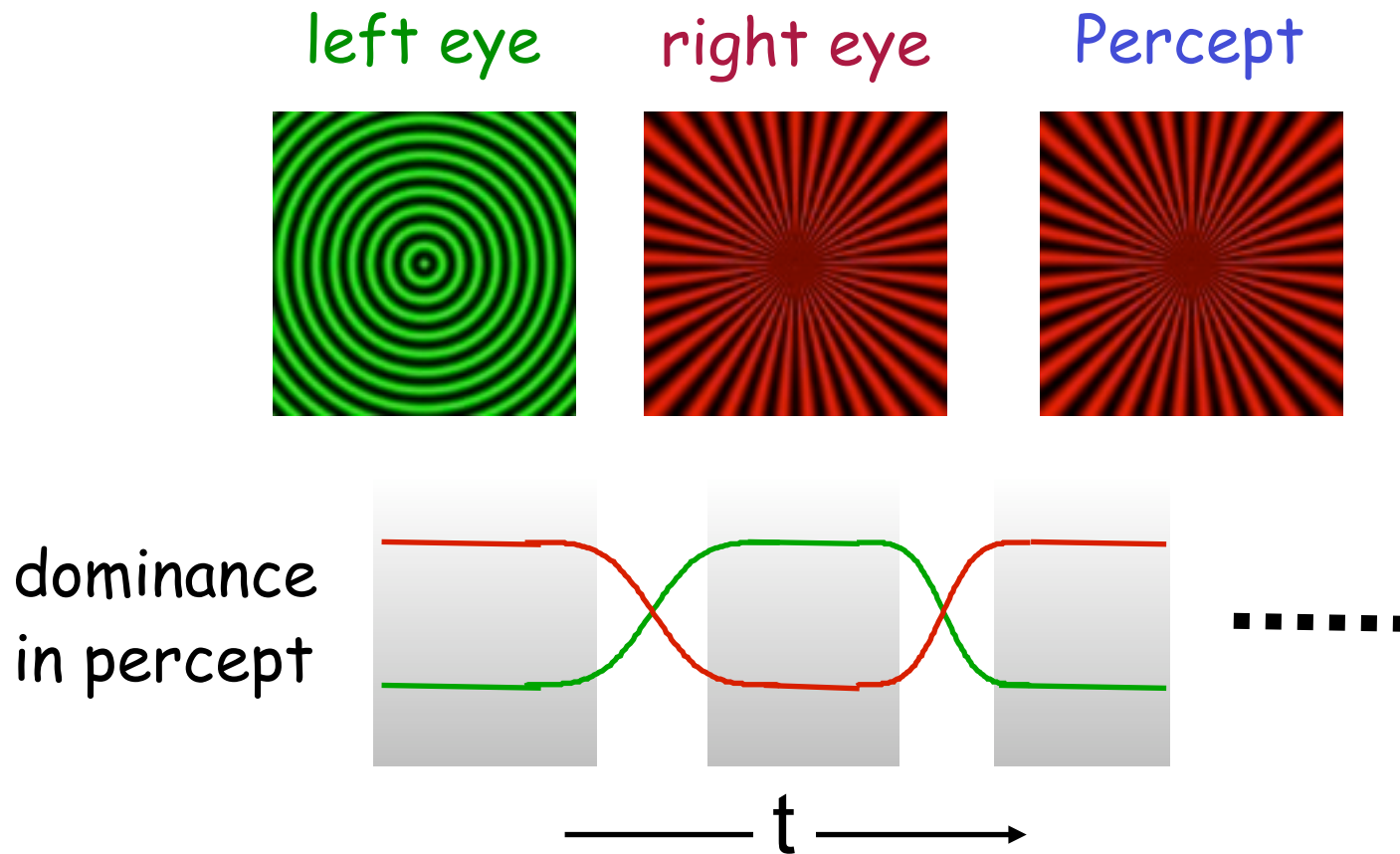


# Part I: Spatiotemporal dynamics during binocular rivalry

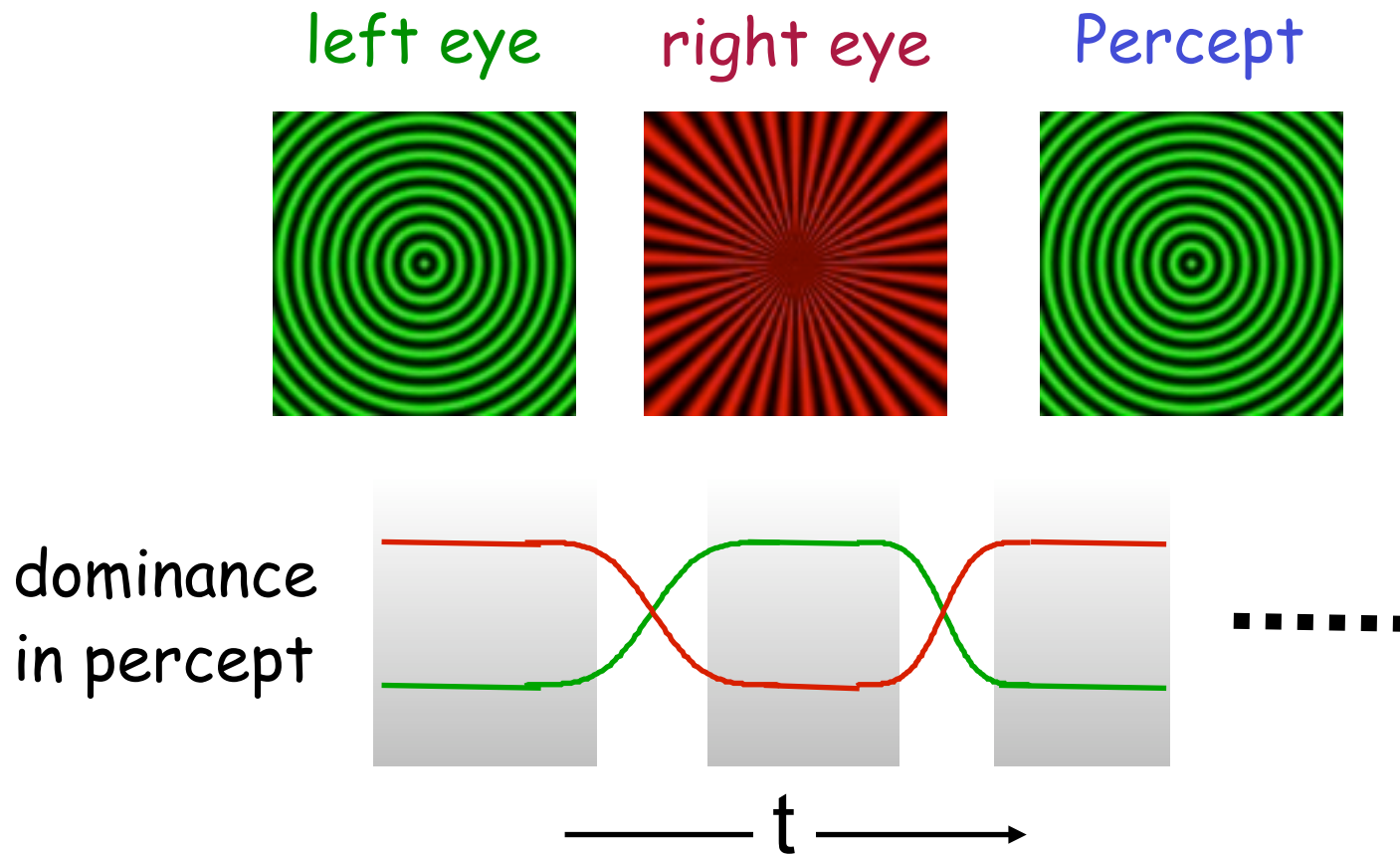




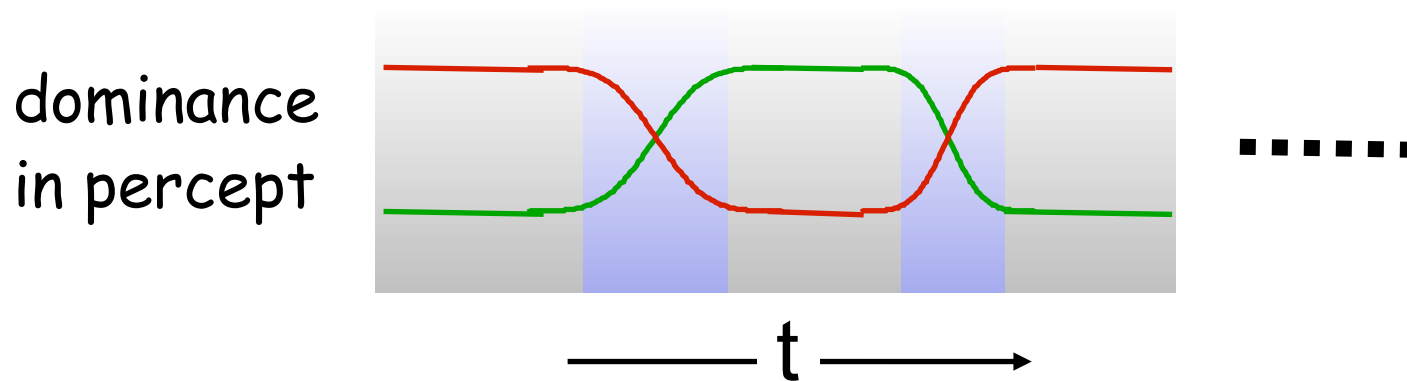
# Part I: Spatiotemporal dynamics during binocular rivalry



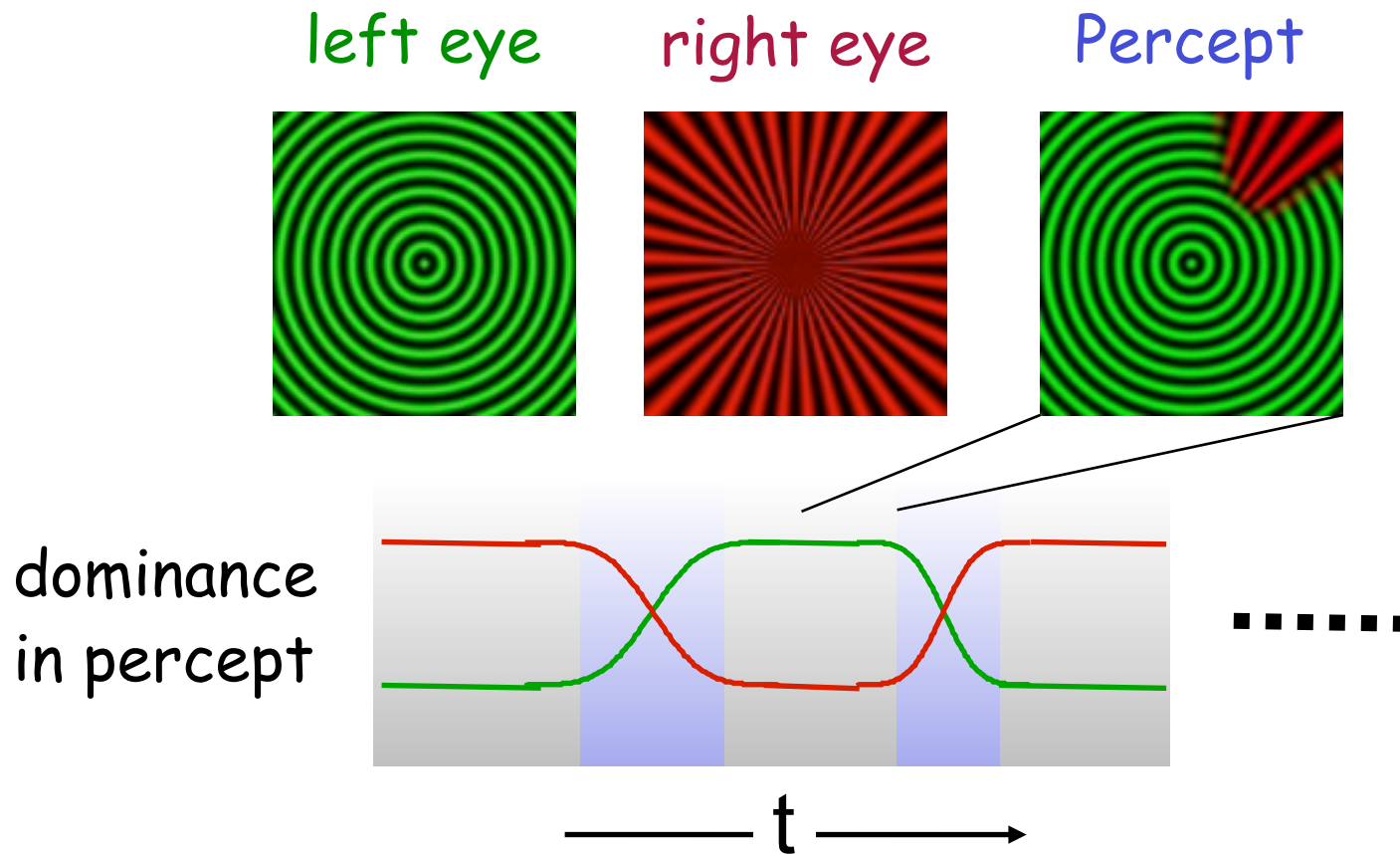
# Part I: Spatiotemporal dynamics during binocular rivalry



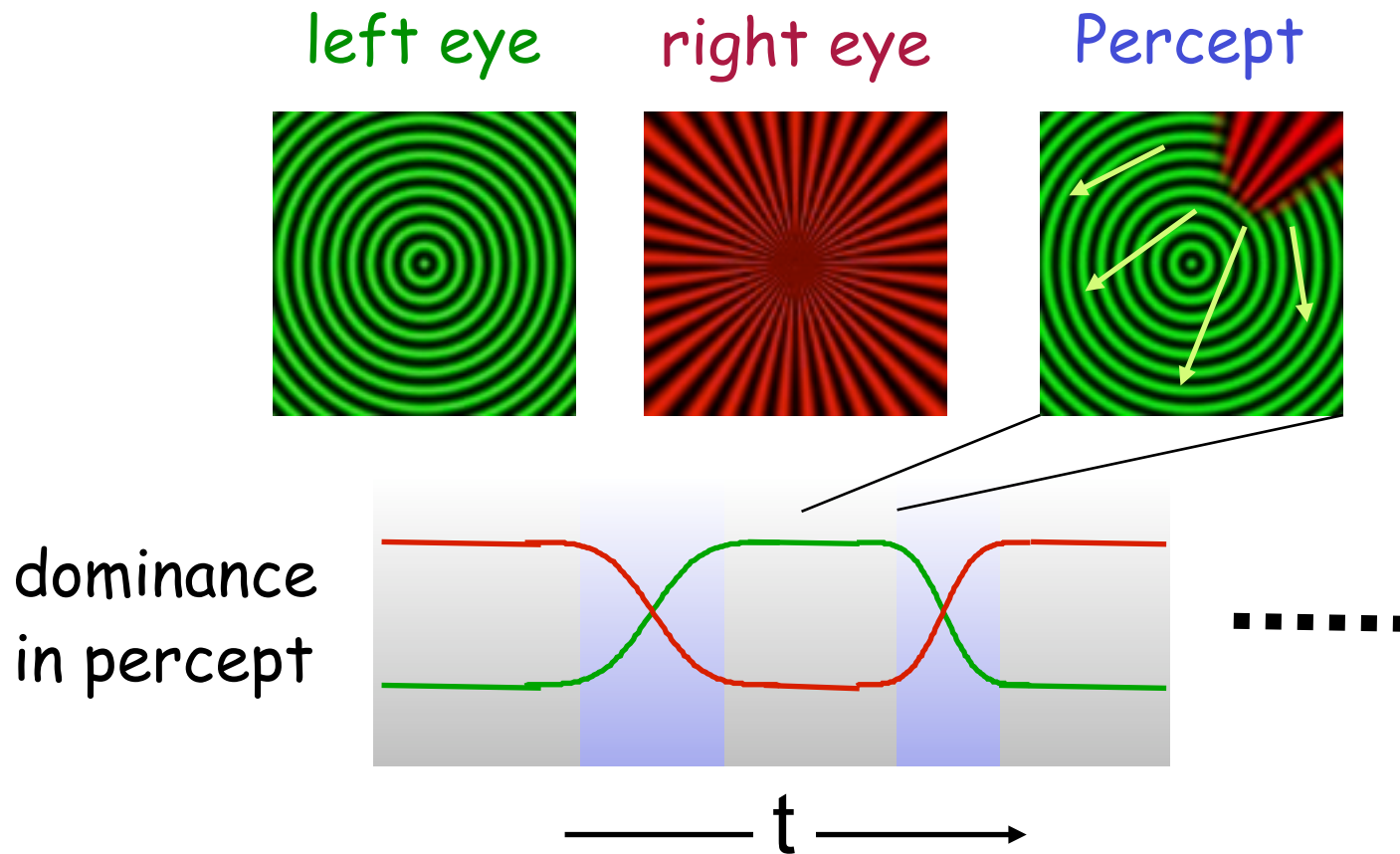
# Part I: Spatiotemporal dynamics during binocular rivalry



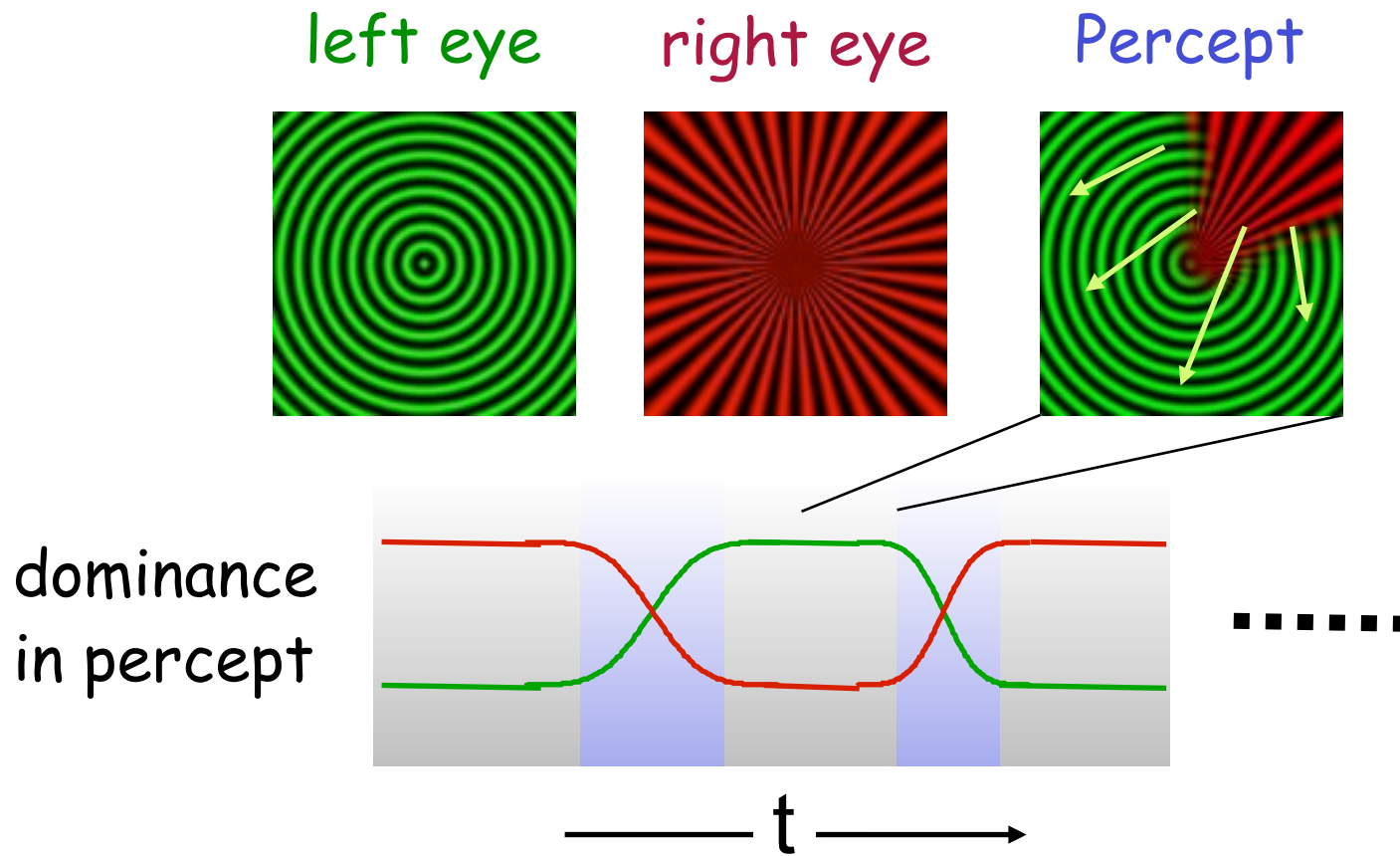
# Part I: Spatiotemporal dynamics during binocular rivalry



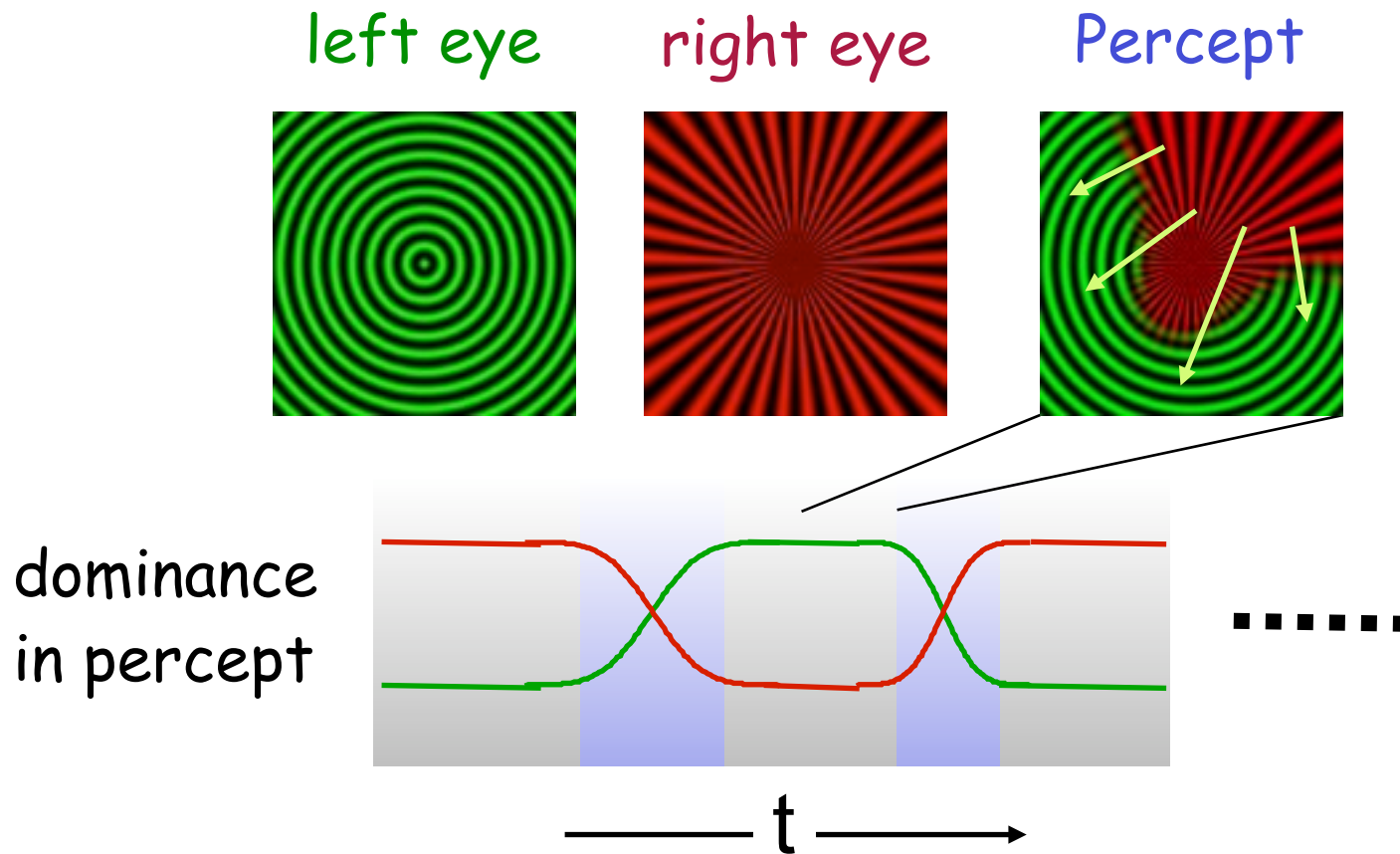
# Part I: Spatiotemporal dynamics during binocular rivalry



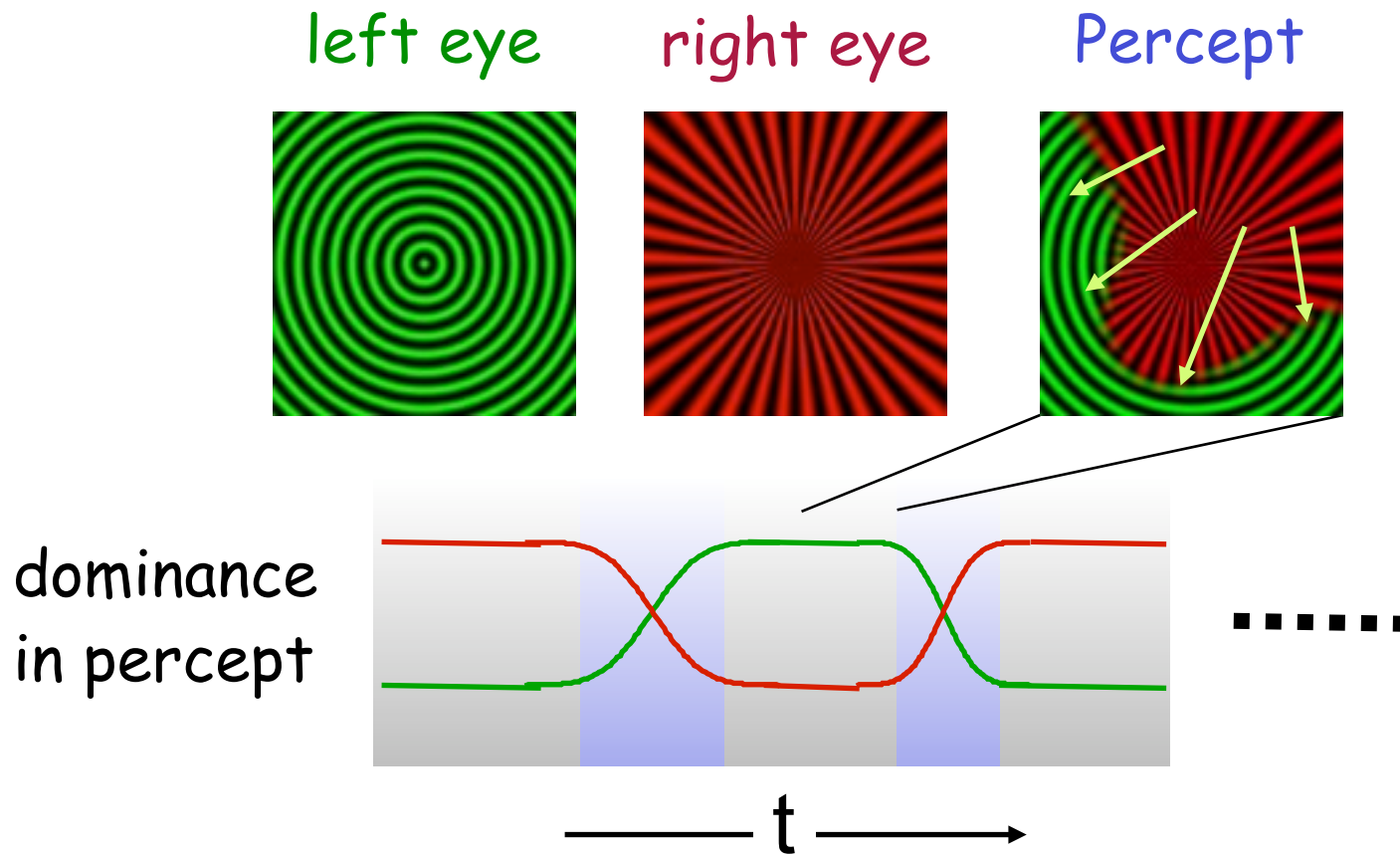
# Part I: Spatiotemporal dynamics during binocular rivalry



# Part I: Spatiotemporal dynamics during binocular rivalry

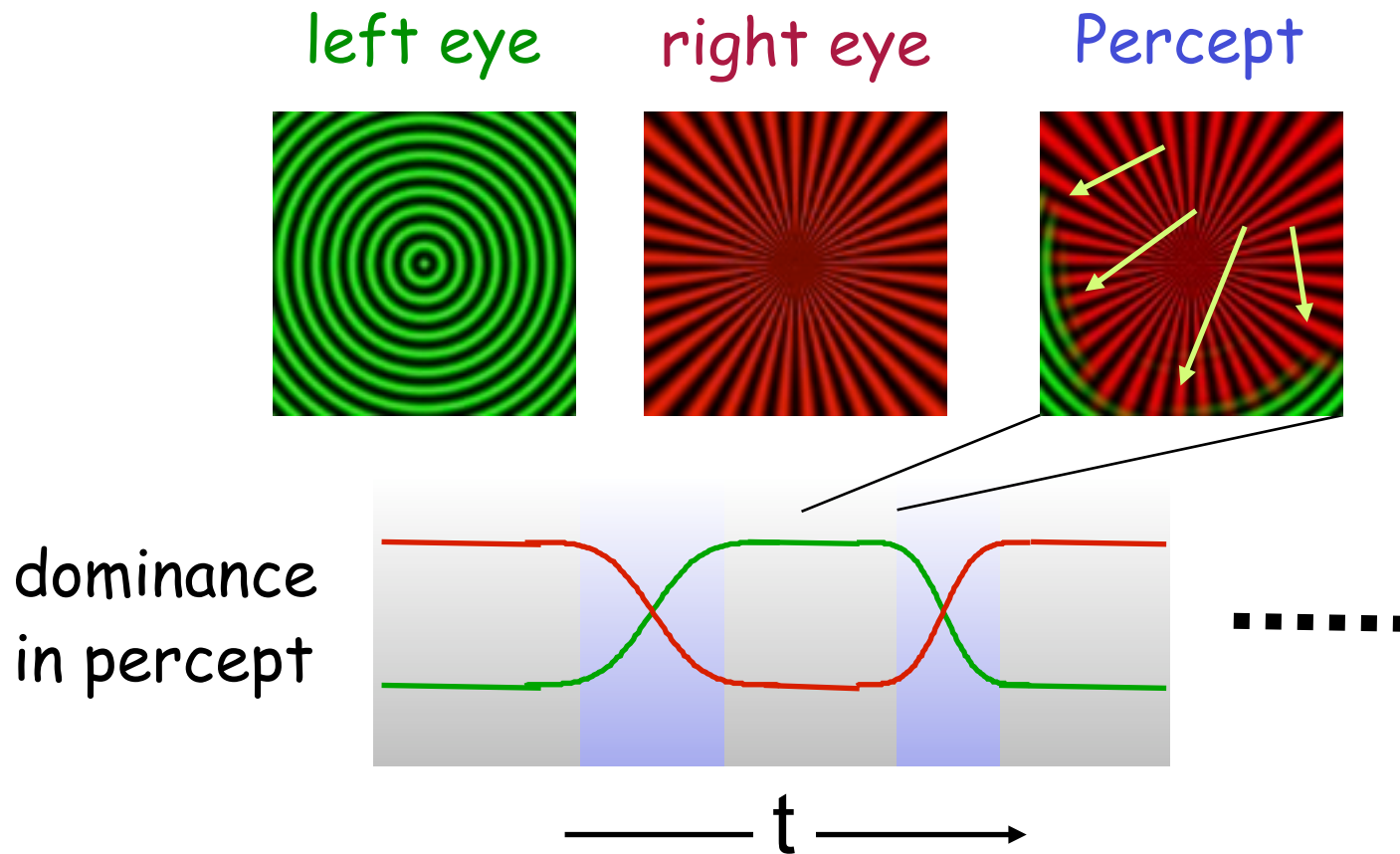


# Part I: Spatiotemporal dynamics during binocular rivalry

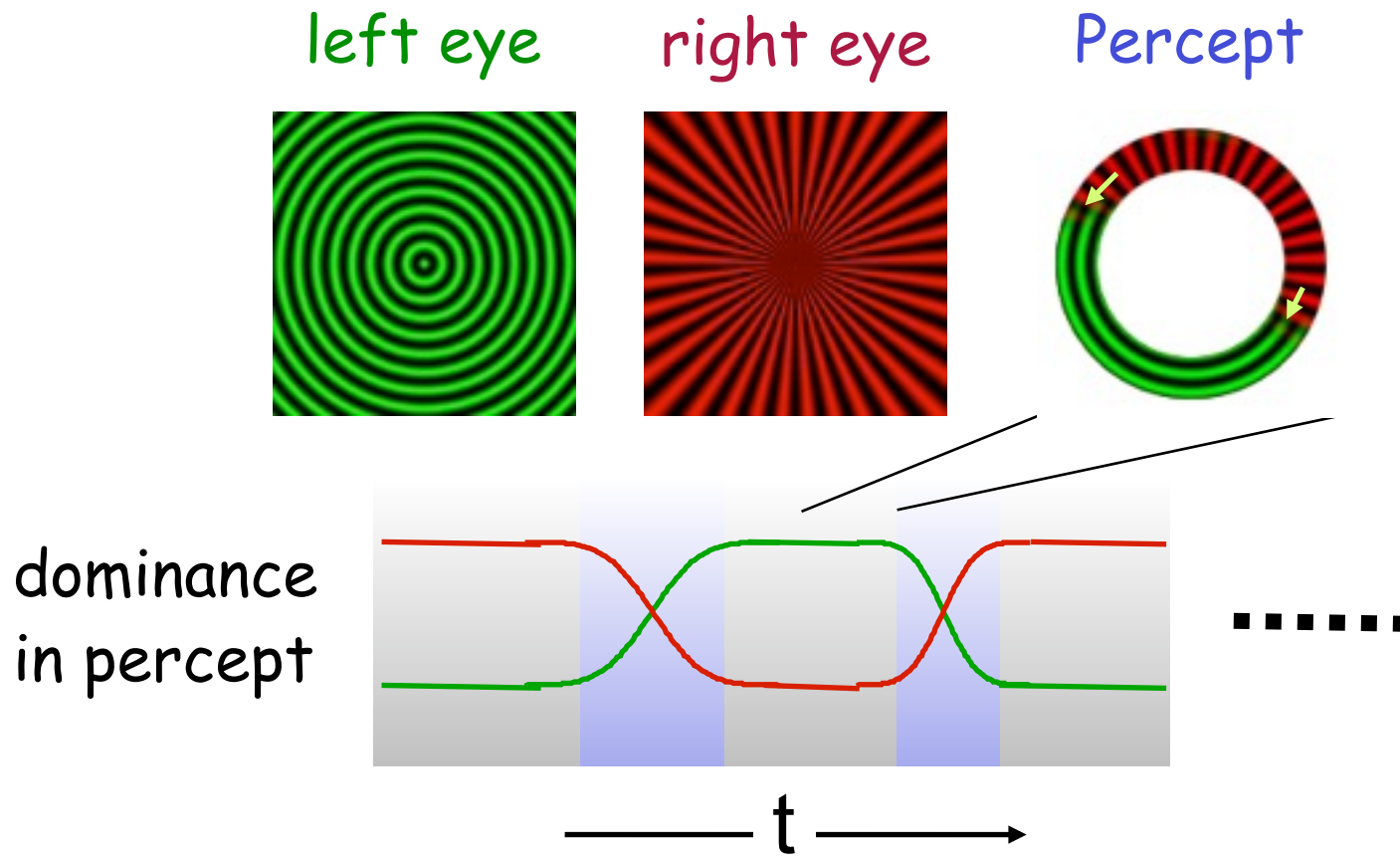




# Part I: Spatiotemporal dynamics during binocular rivalry



# Part I: Spatiotemporal dynamics during binocular rivalry



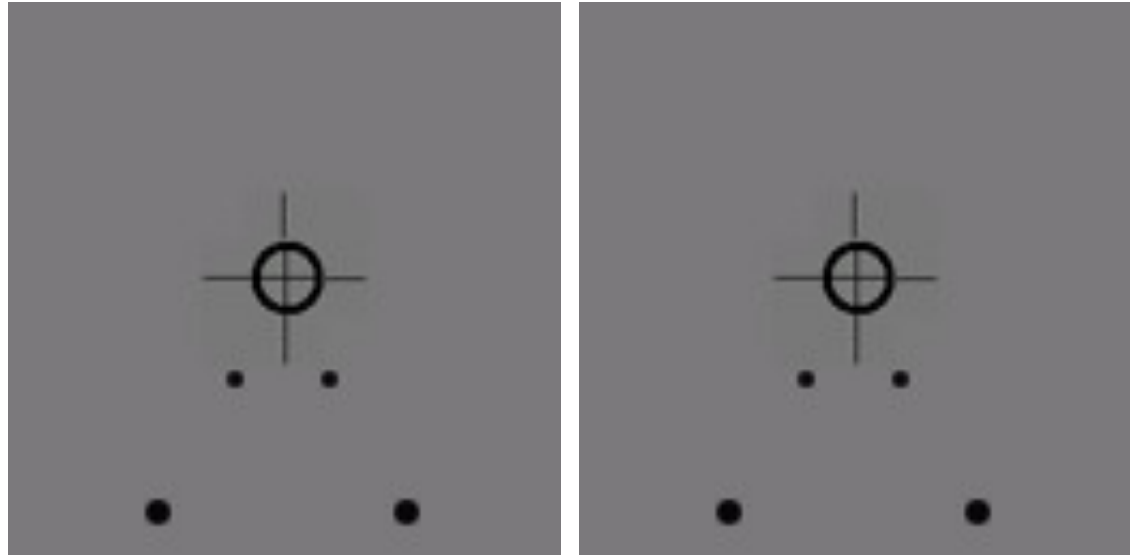


# Perceptual traveling waves

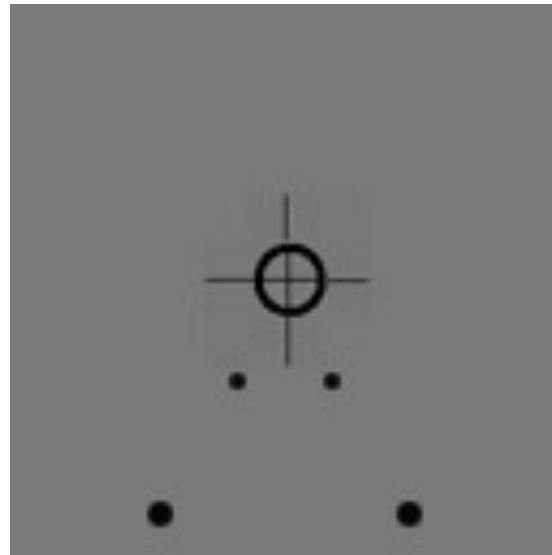
left eye

right eye

Display



Percept



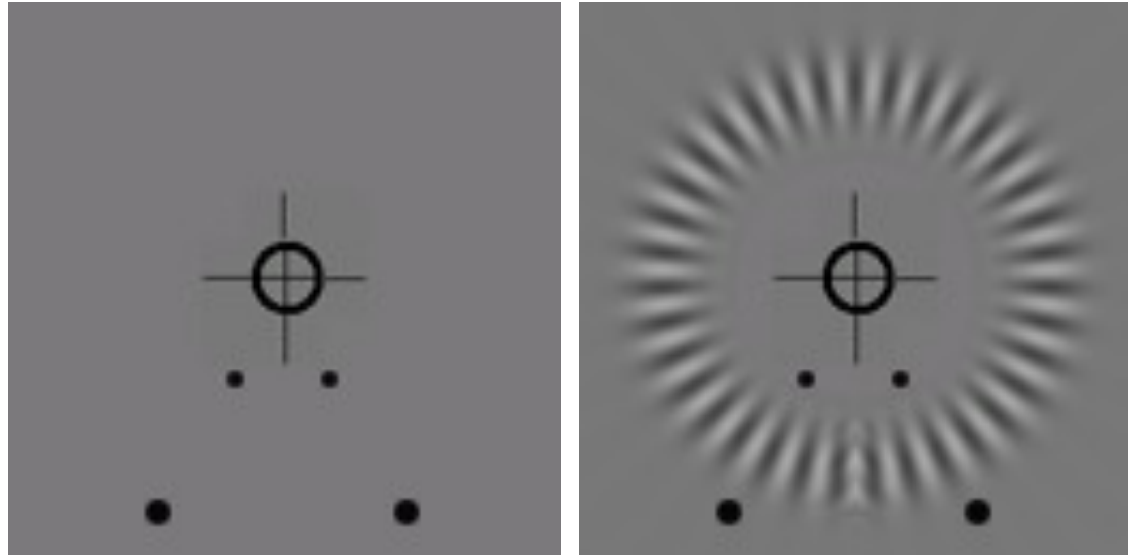
Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Perceptual traveling waves

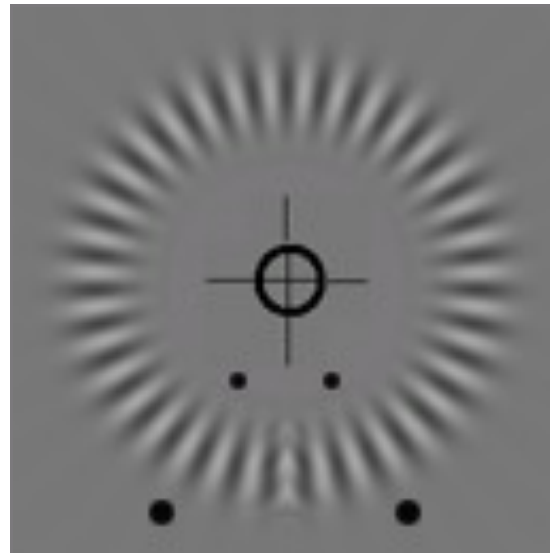
left eye

right eye

Display



Percept



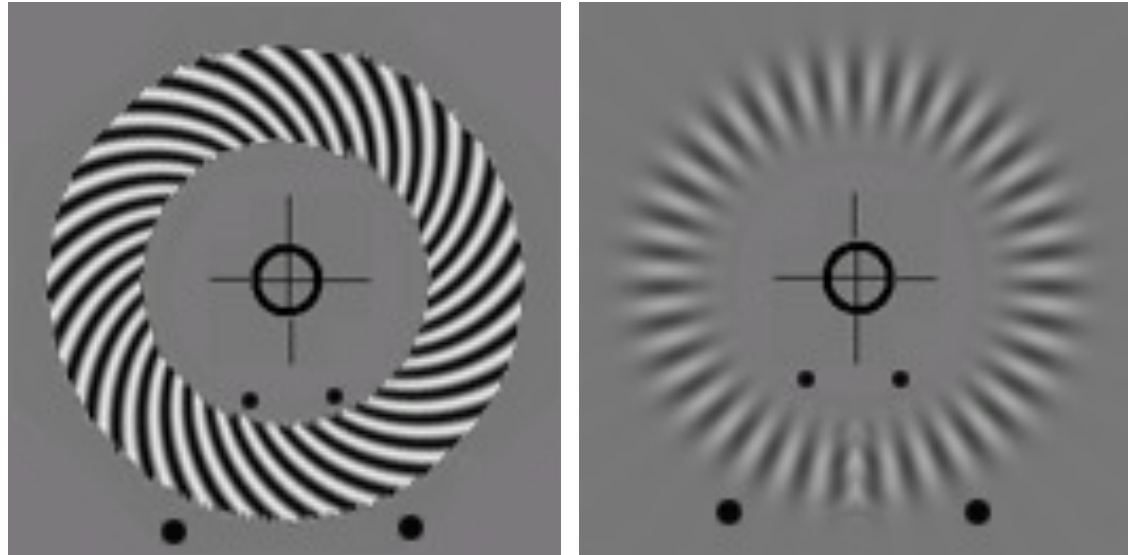
Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Perceptual traveling waves

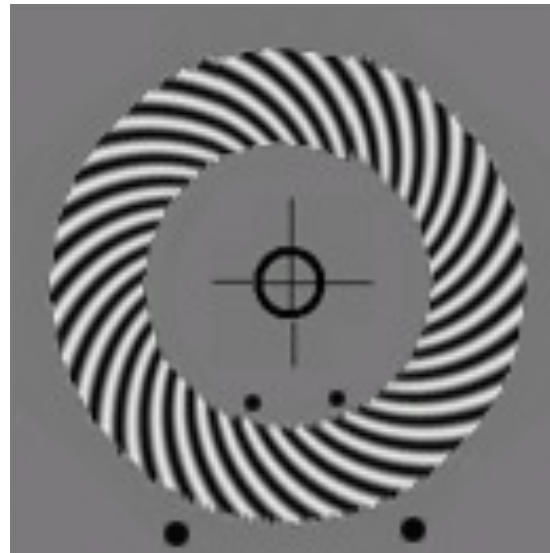
left eye

right eye

Display



Percept



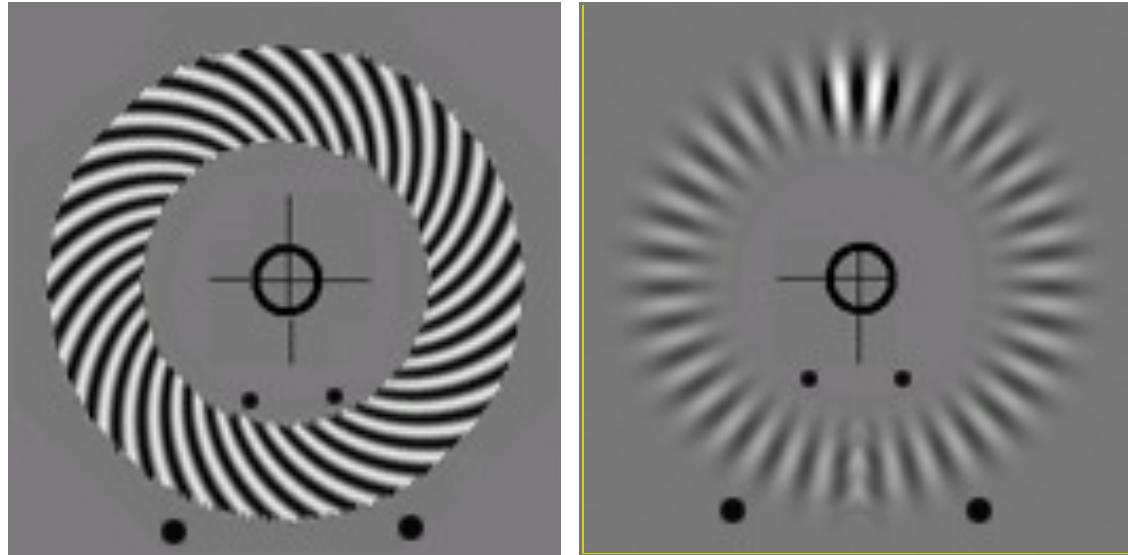
Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Perceptual traveling waves

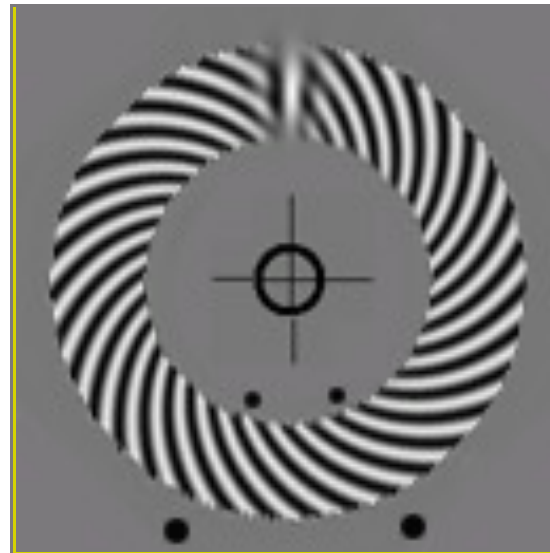
left eye

right eye

Display



Percept



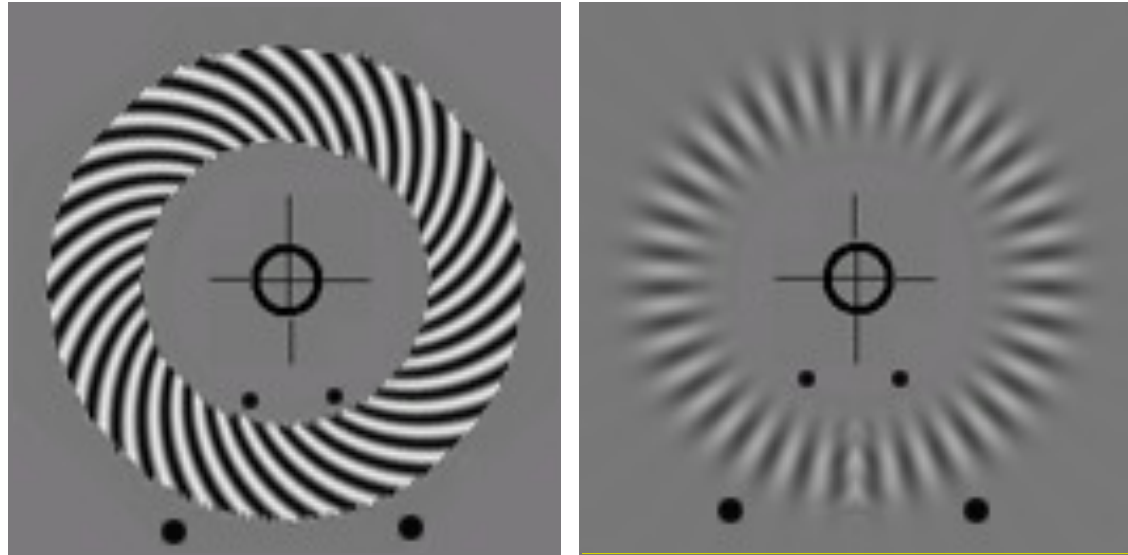
Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Perceptual traveling waves

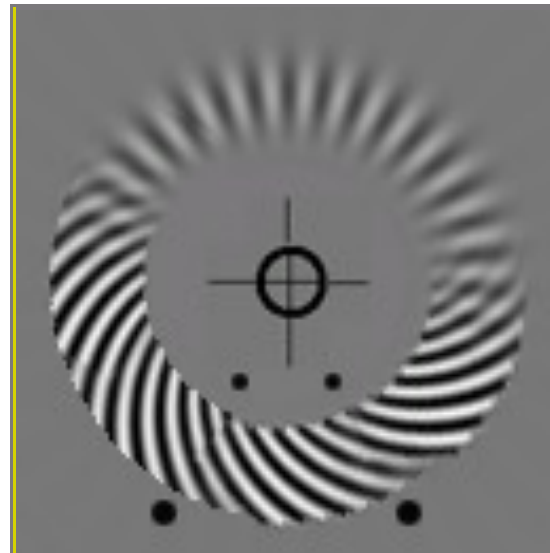
left eye

right eye

Display



Percept



Lee, Blake, & Heeger,  
Nature Neurosci (2005)

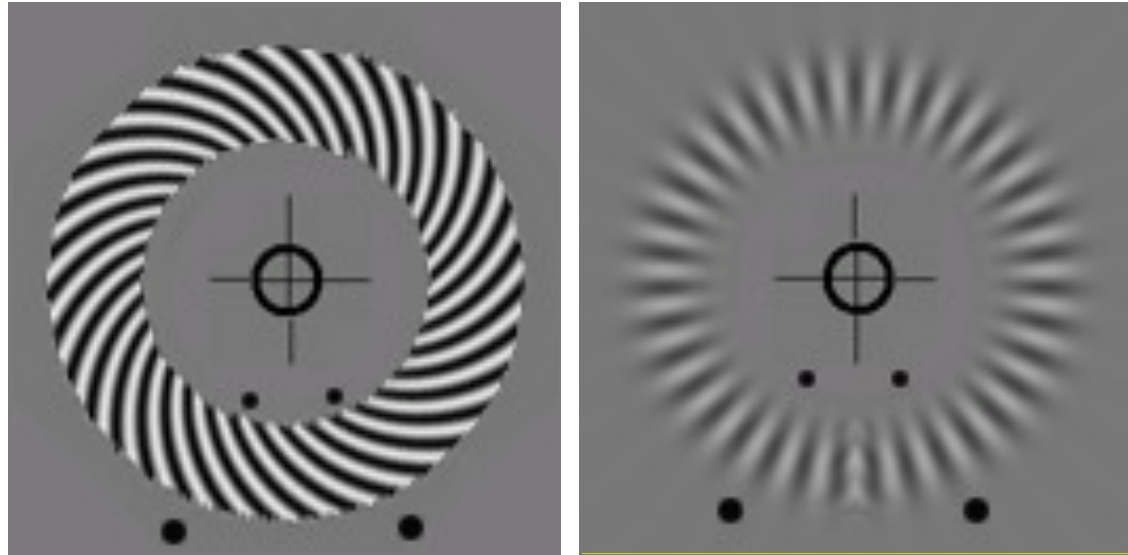


# Perceptual traveling waves

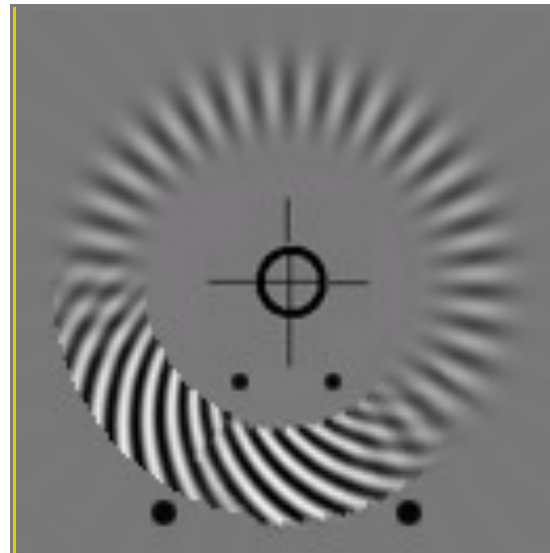
left eye

right eye

Display



Percept



Latency

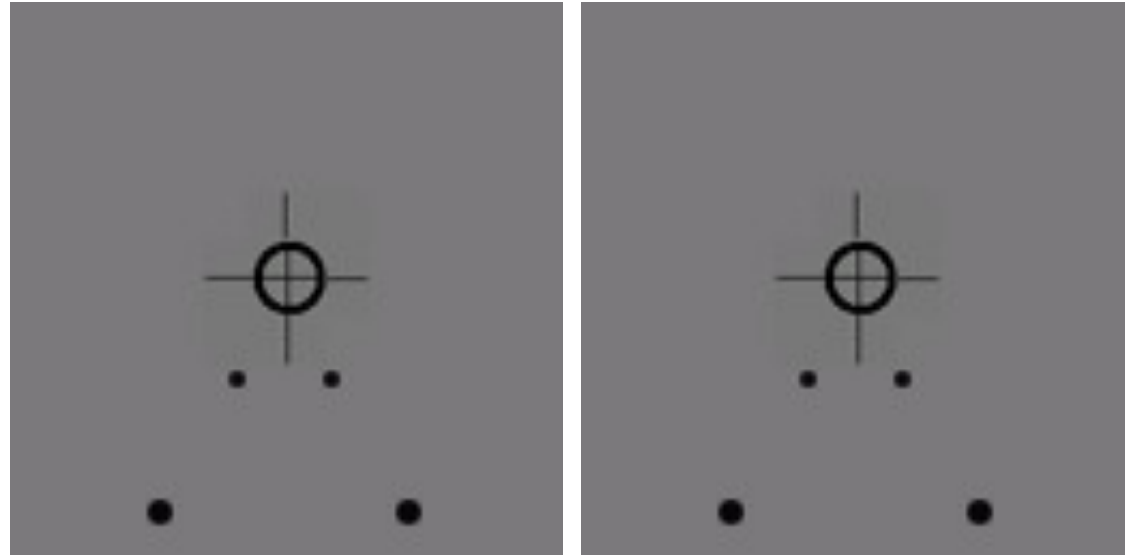
Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Perceptual traveling waves

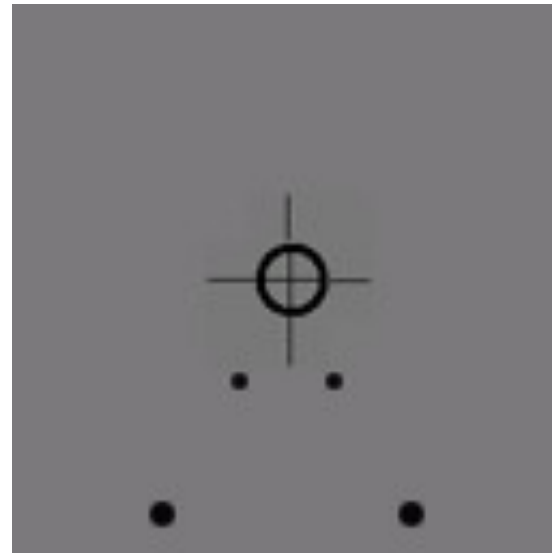
left eye

right eye

Display



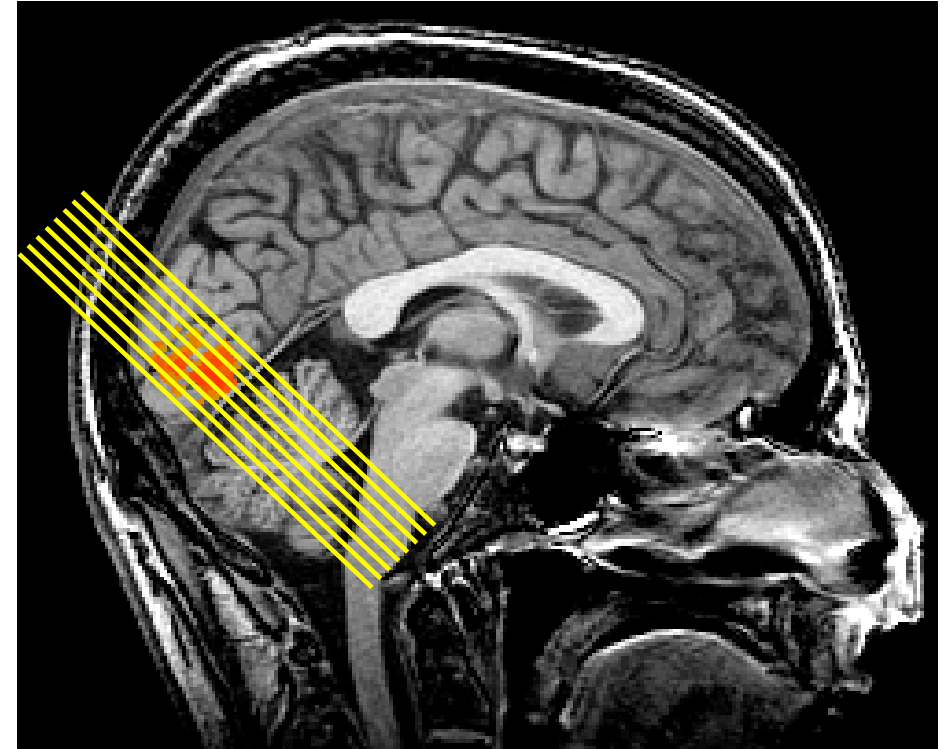
Percept



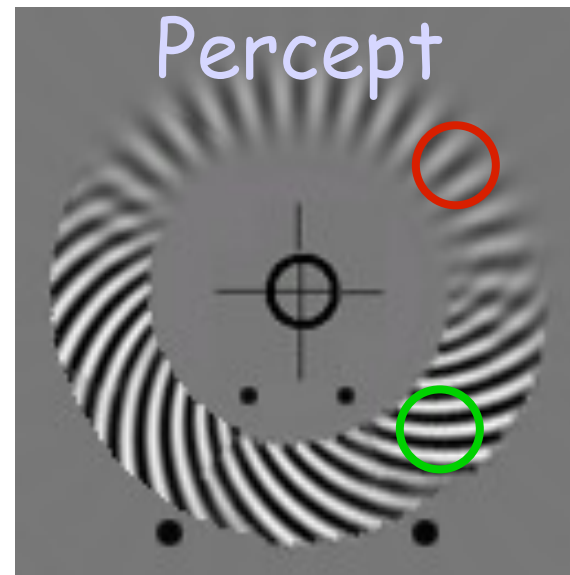
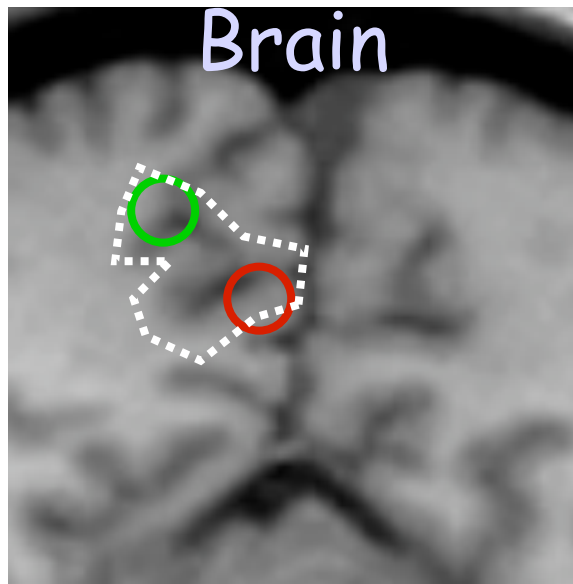
Latency  
L / R / N

Lee, Blake, & Heeger,  
Nature Neurosci (2005)

# Functional magnetic resonance imaging

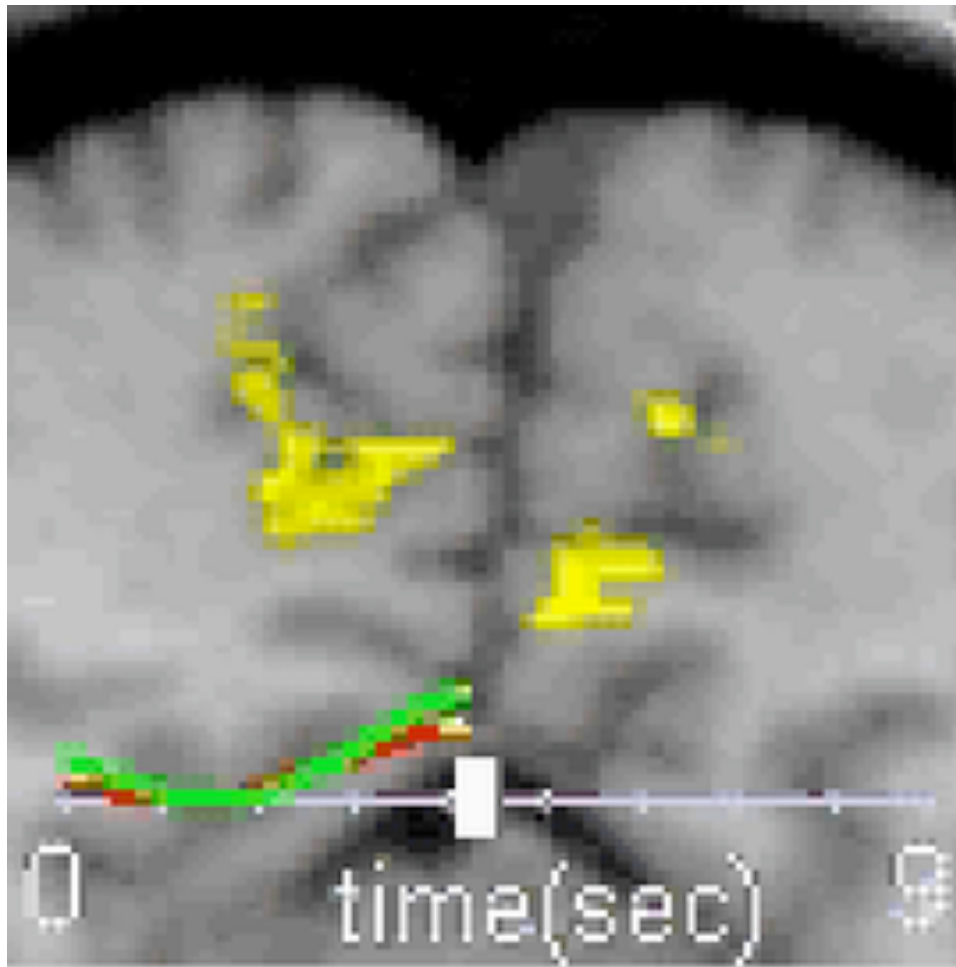


# Prediction: traveling waves of cortical activity

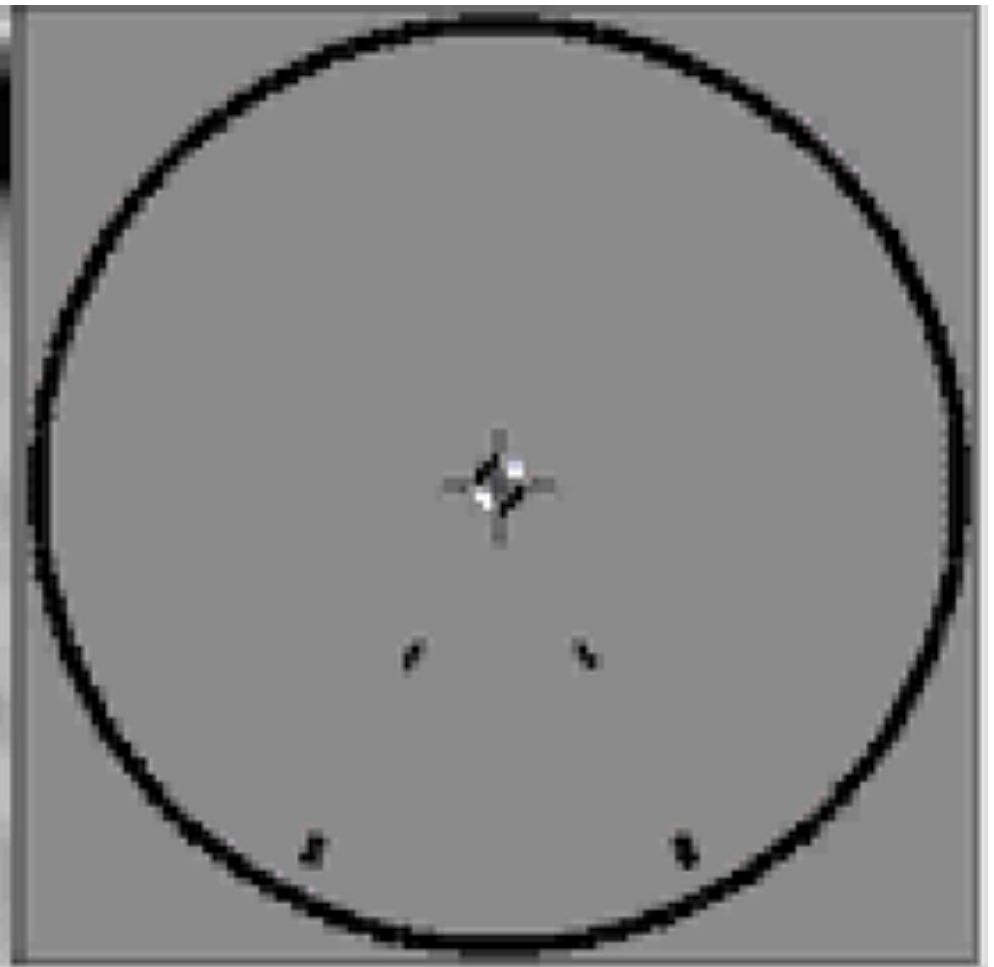


# Perceptual and neural traveling waves

Peak fMRI response



Percept



Lee, Blake, & Heeger, Nature Neurosci (2005)

# Visual cortical areas

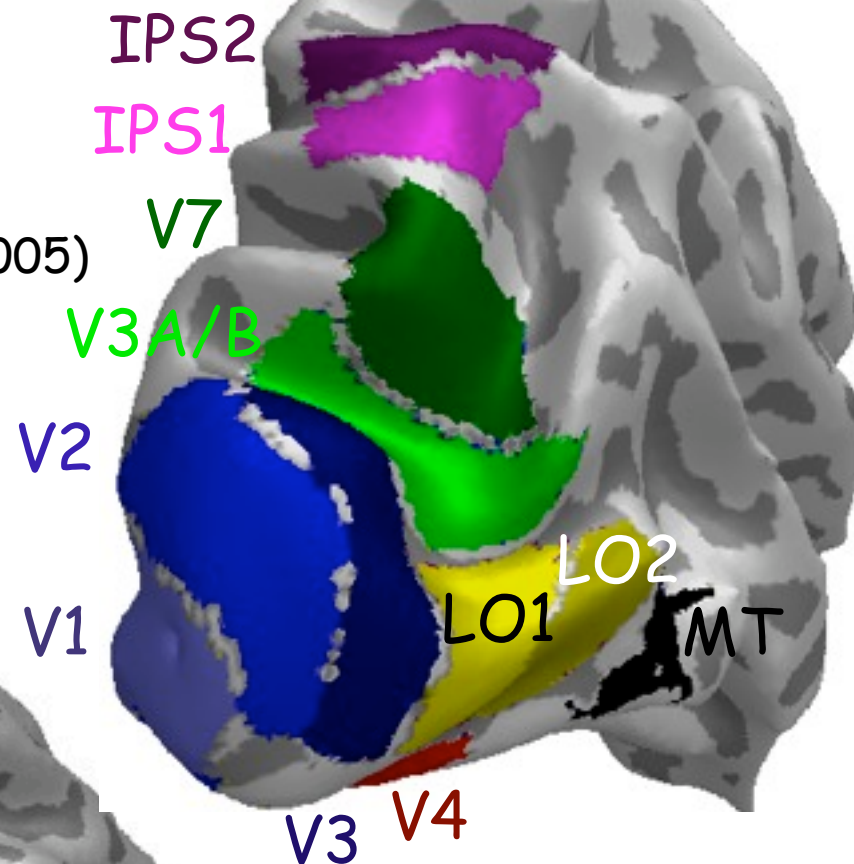
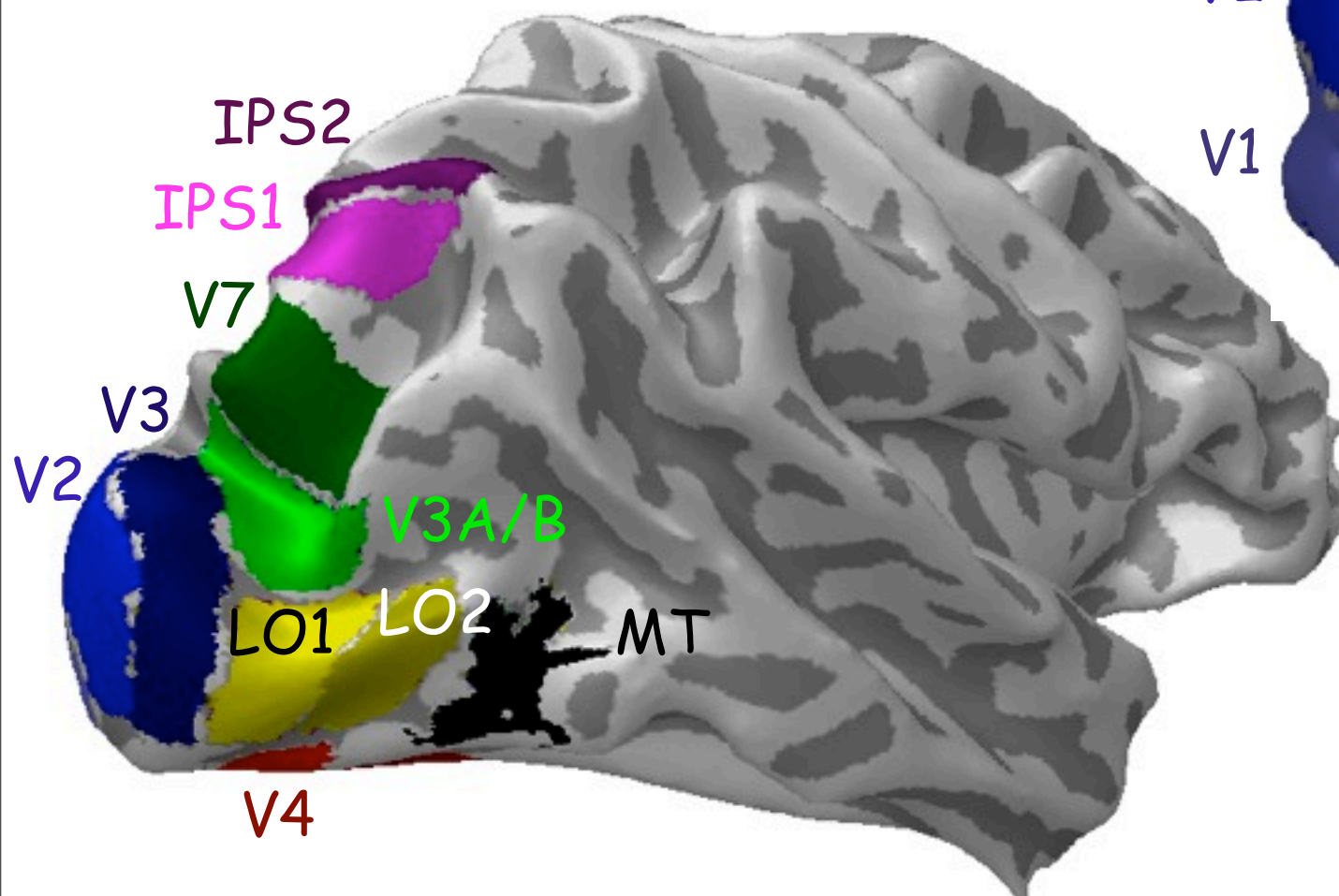
**LO1 and LO2:**

Larsson & Heeger, *J Neurosci* (2006)

**IPS1 and IPS2:**

Schluppeck, Glimcher, & Heeger, *J Neurophysiol* (2005)

Silver, Ress, & Heeger, *J Neurophysiol* (2005)



# Retinotopy

Radial component



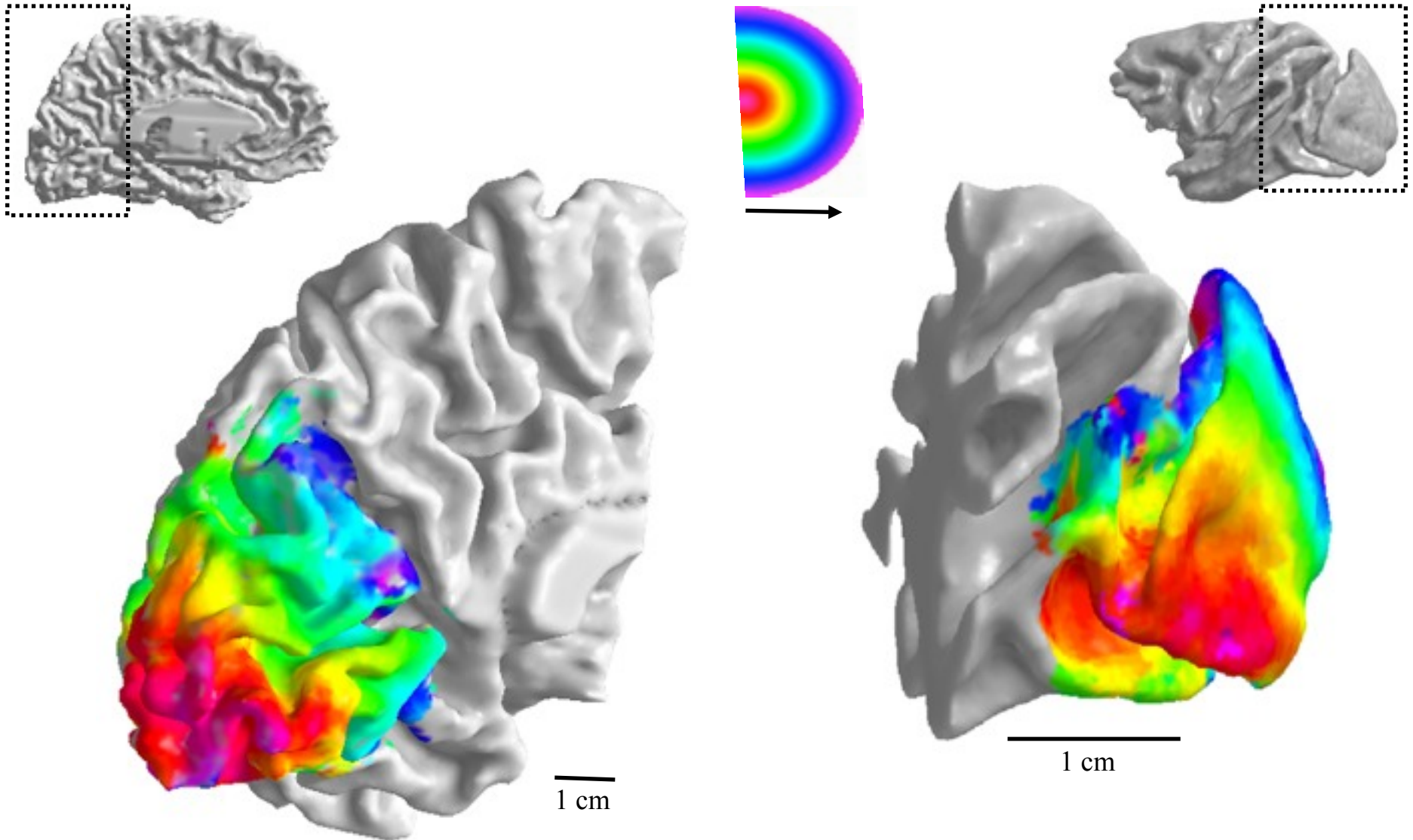
Angular component



Engel et al, Nature (1994)



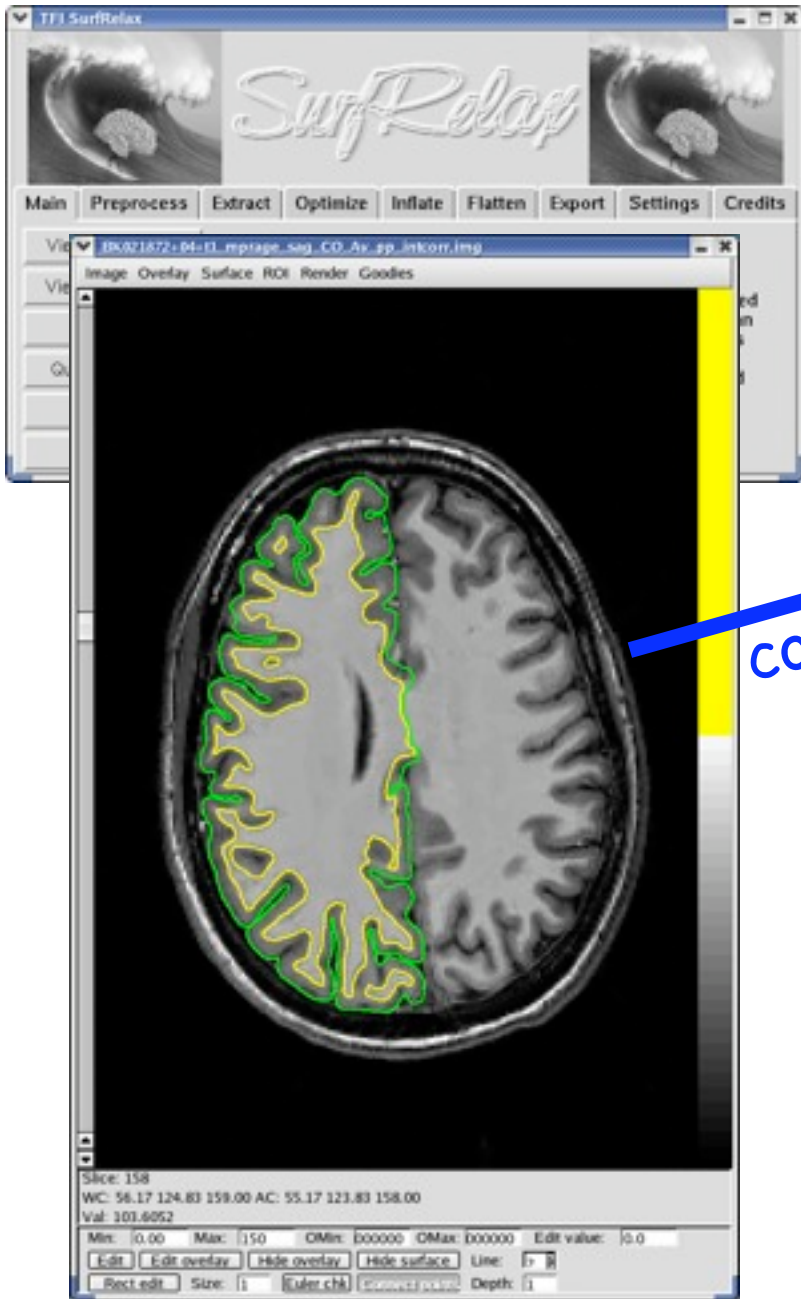
# Retinotopy: radial component



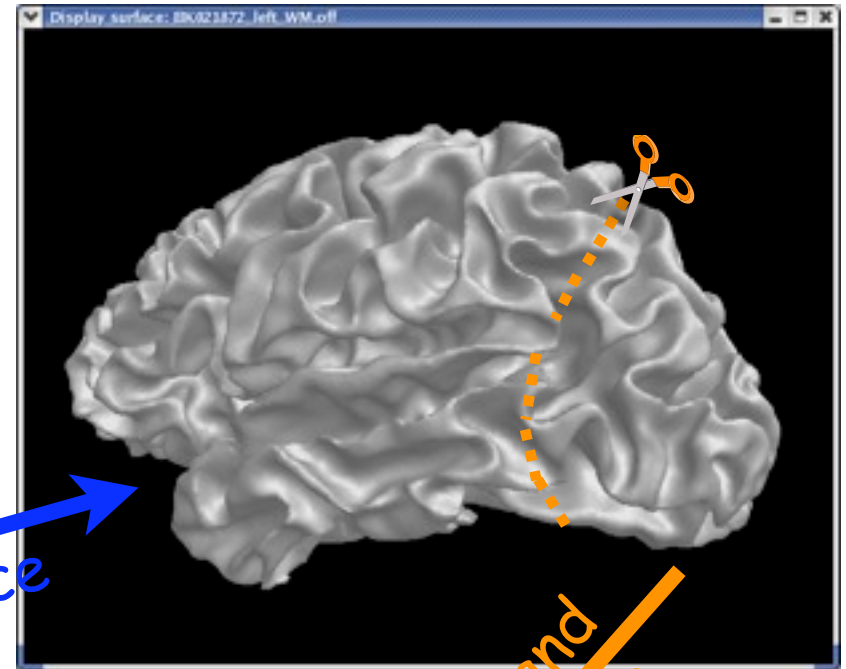
Brewer, Wandell, & Logothetis



# Cortical segmentation & flattening



extract  
cortical surface

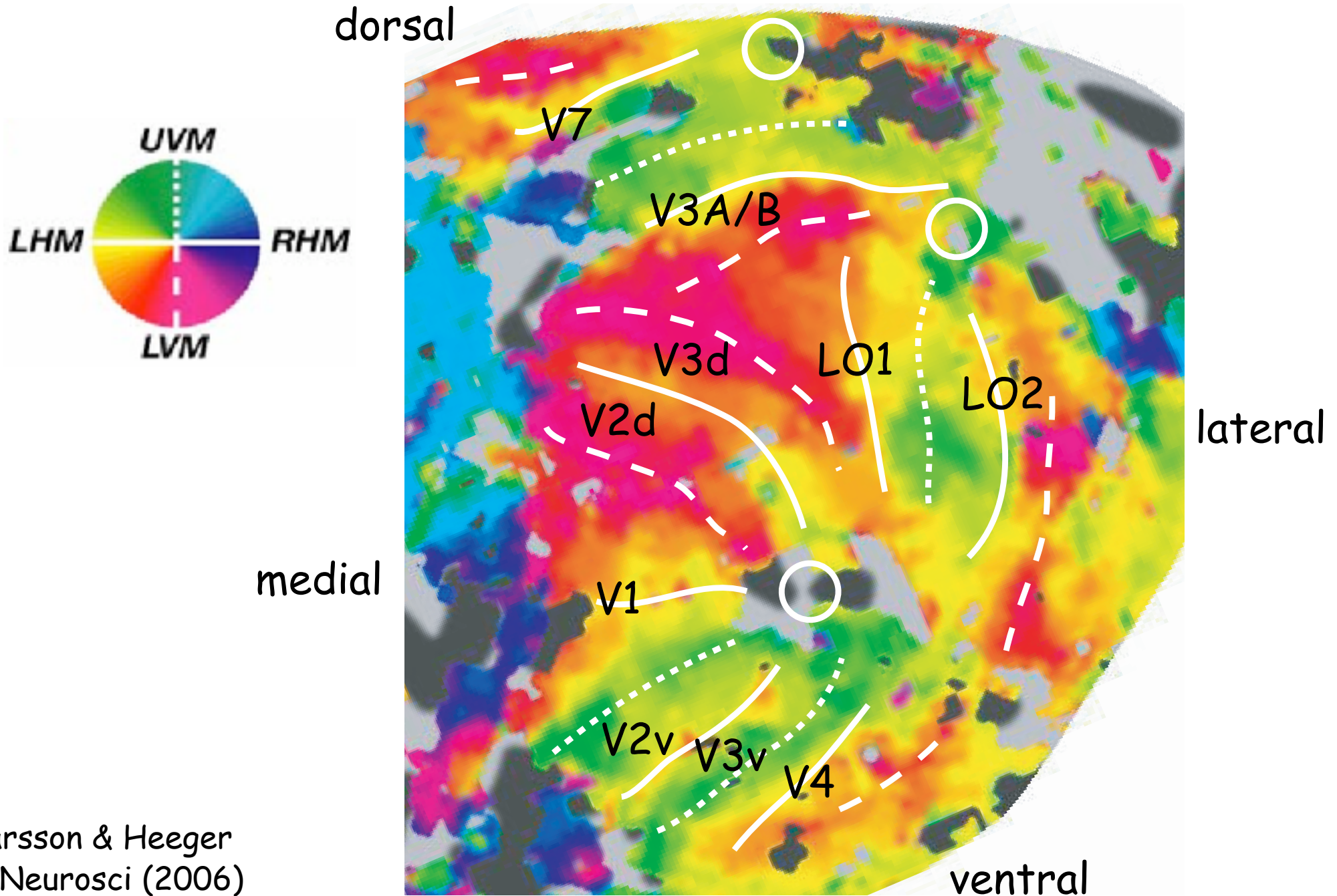


cut and  
flatten



Jonas Larsson

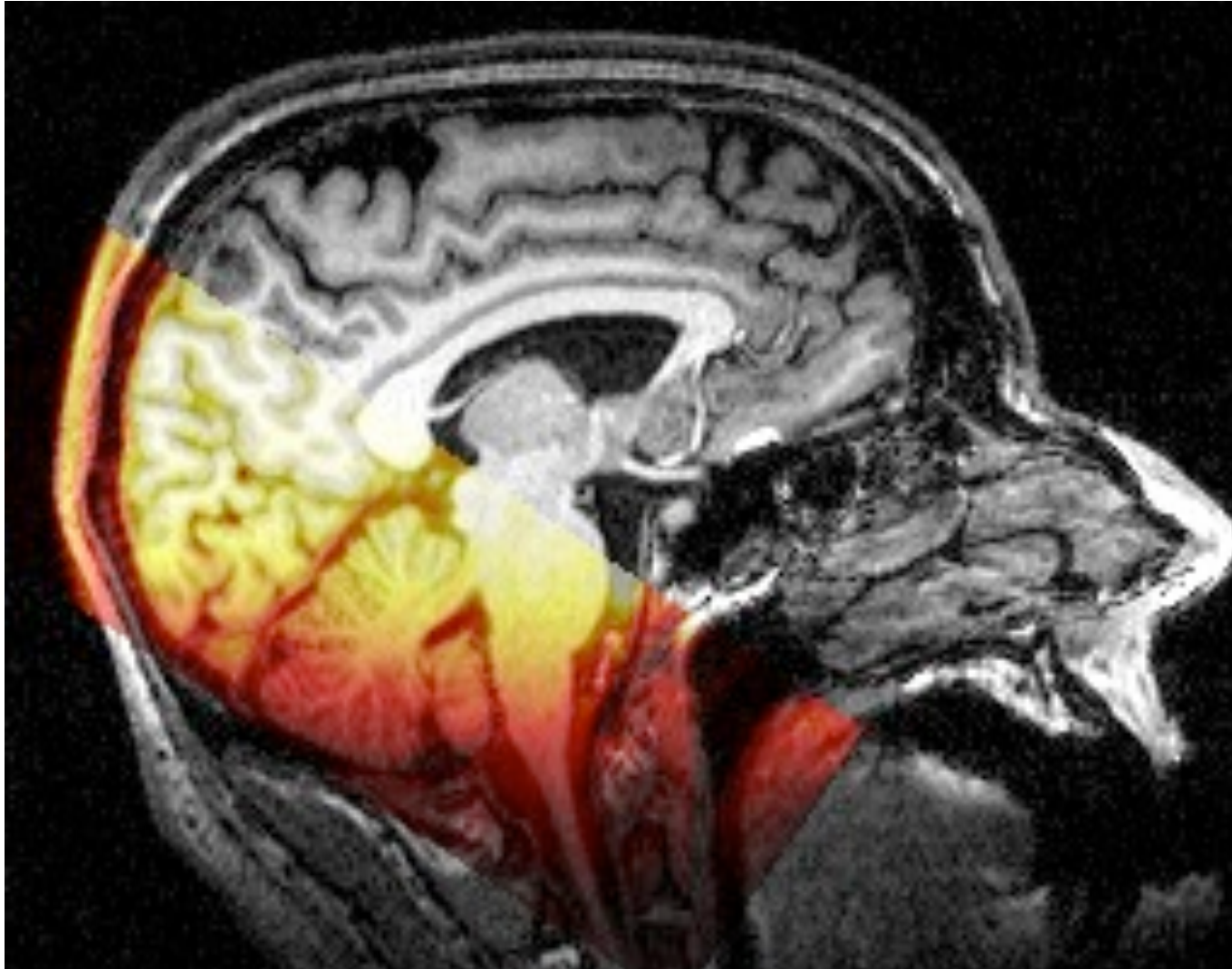
# Retinotopy: angular component



Larsson & Heeger  
J Neurosci (2006)

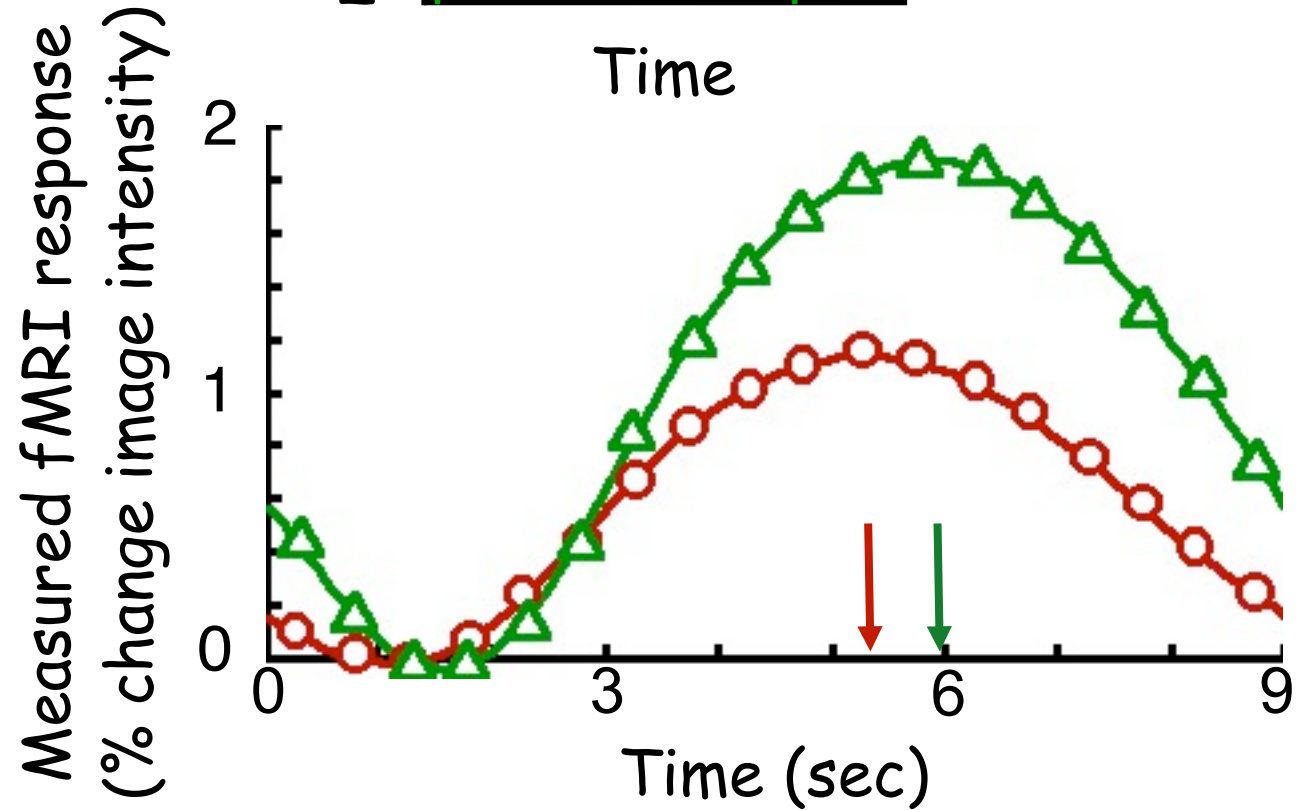
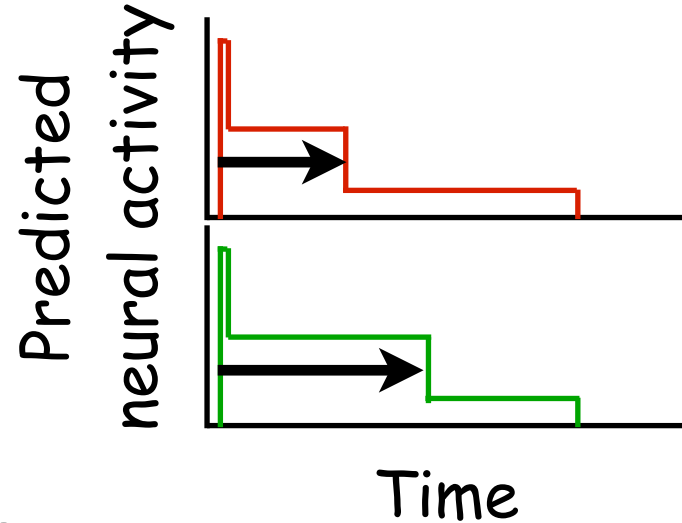
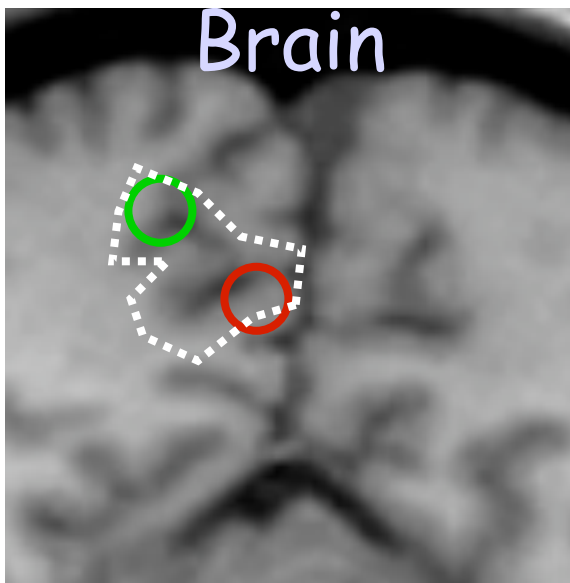
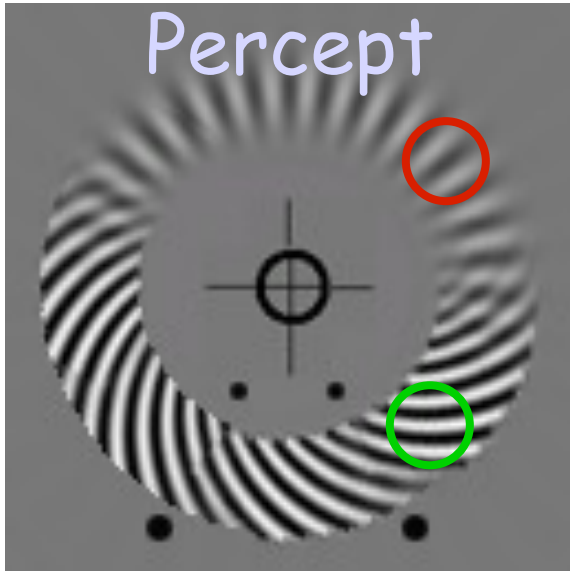


# Alignment across scanning sessions



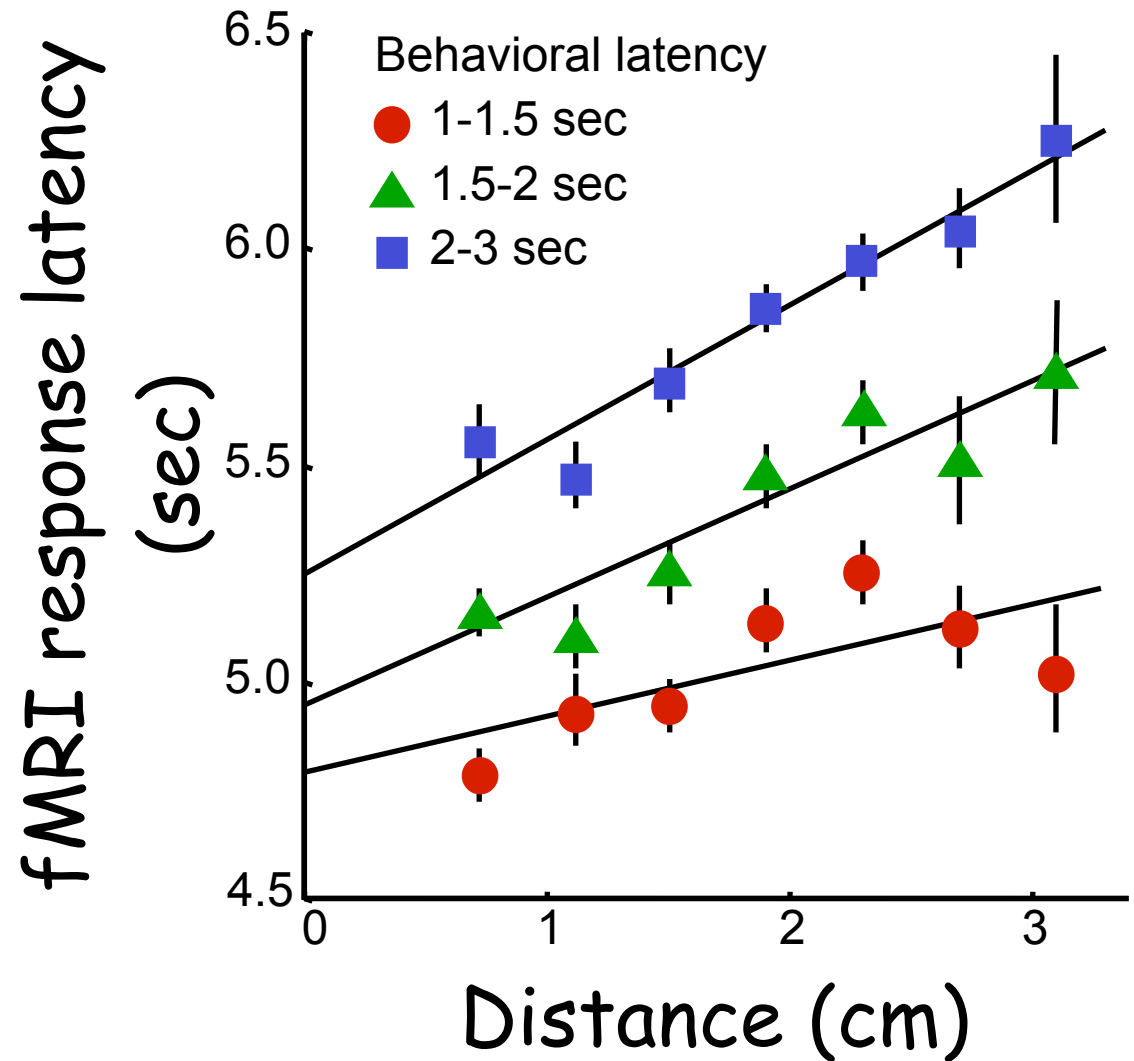
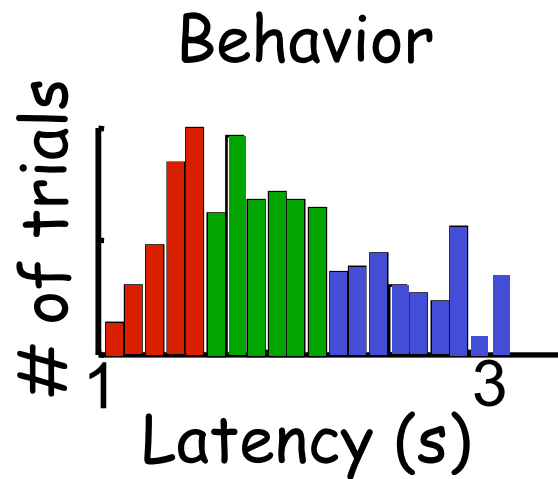
Nestares & Heeger, Magn Reson Med (2000)

# Predicted and measured responses



Lee, Blake, & Heeger, Nature Neurosci (2005)

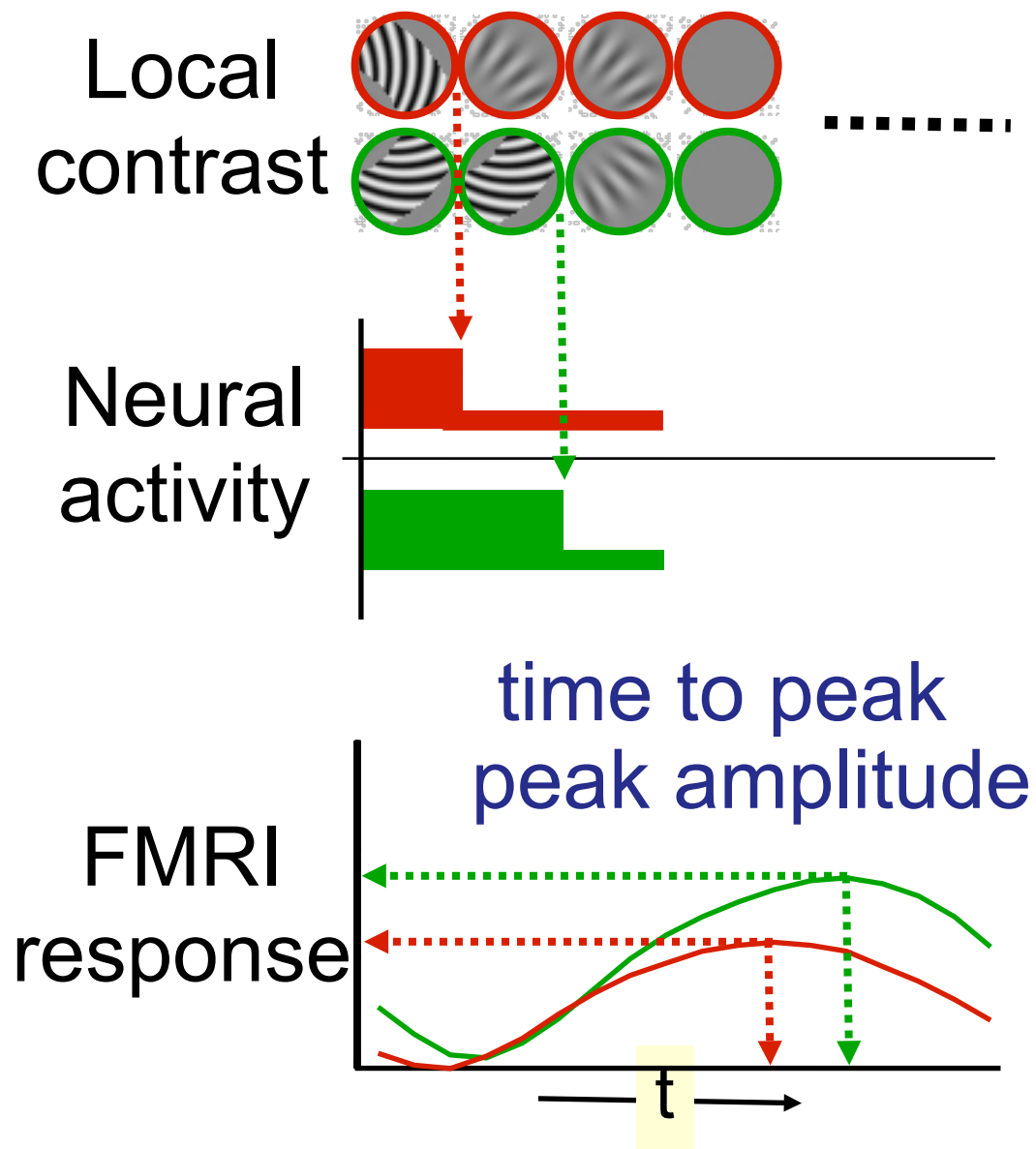
# Activity correlates with perceived latency



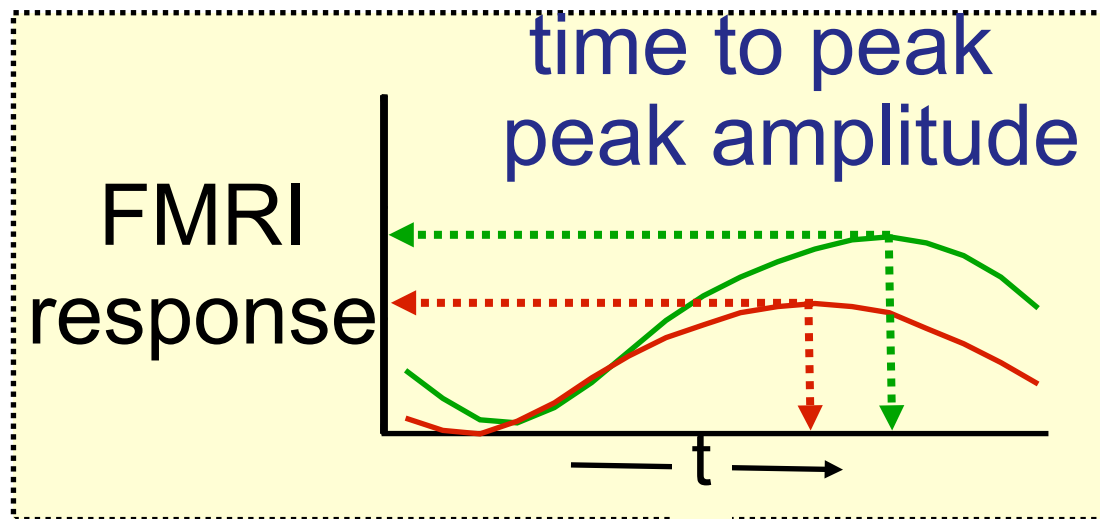
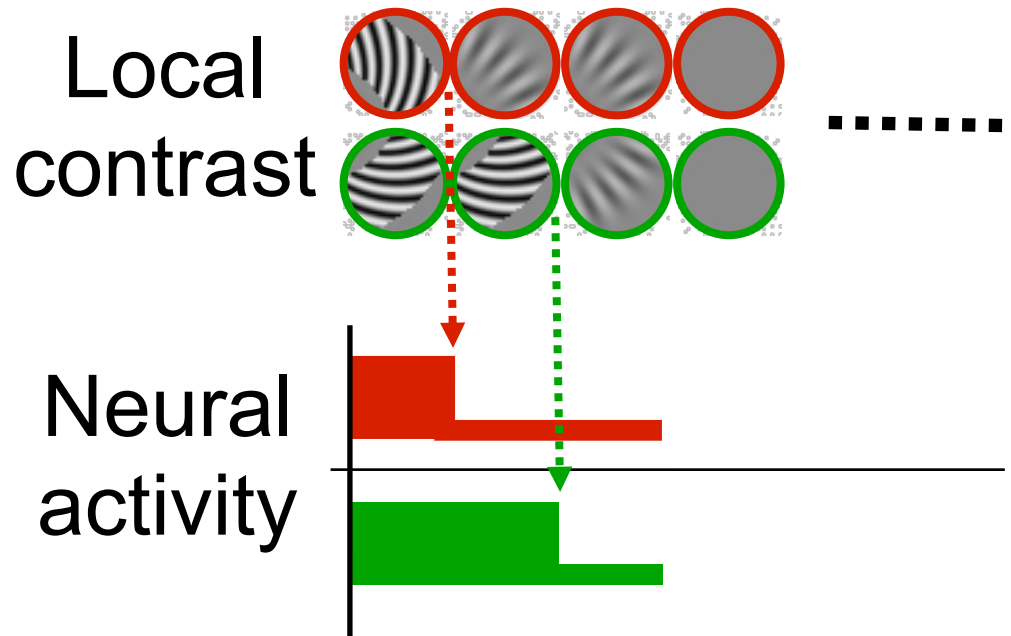
Infer ~115 ms timing difference over ~3.5 mm distance.

Lee, Blake, & Heeger, Nature Neurosci (2005)

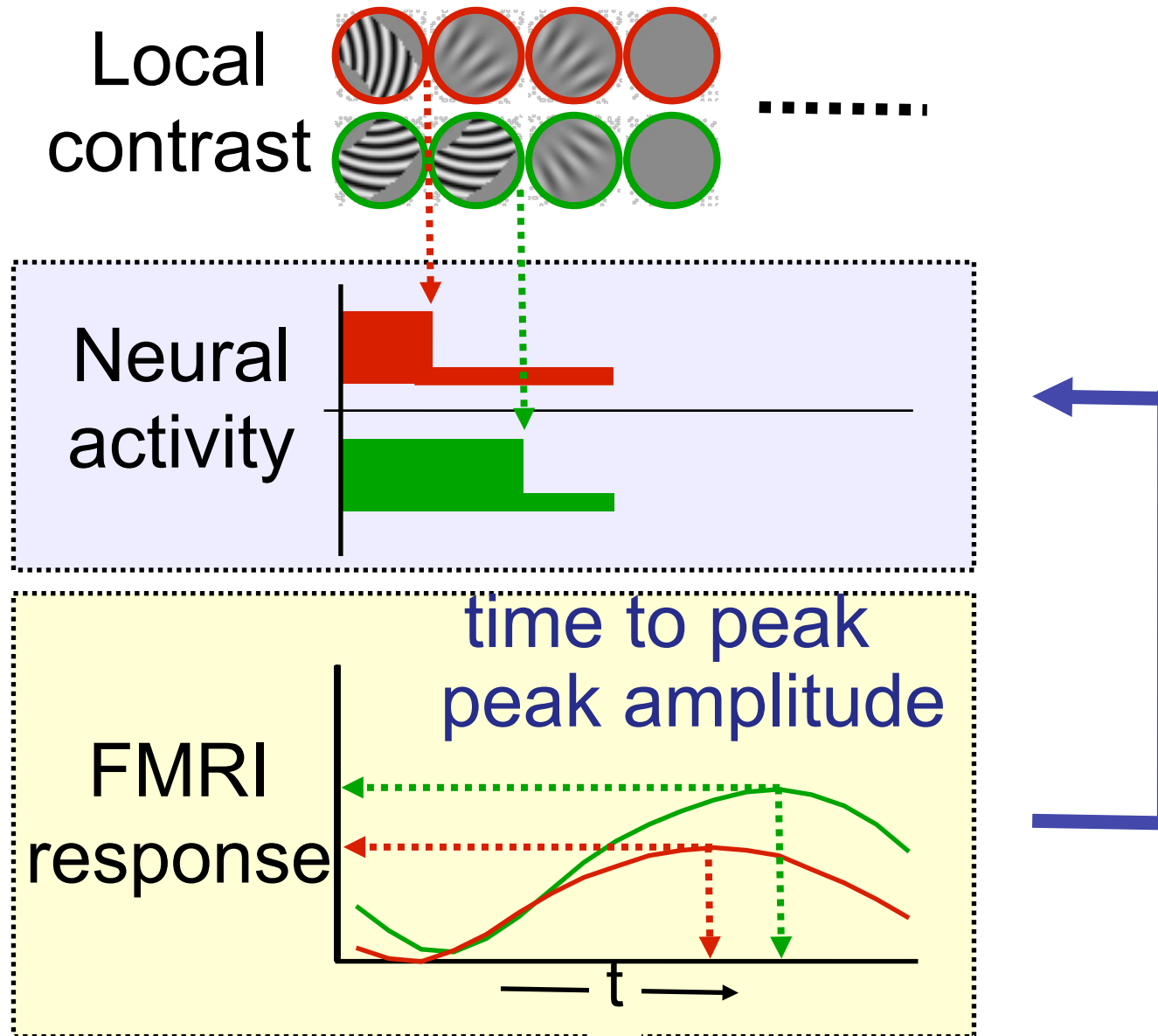
# Estimating neural activity



# Estimating neural activity

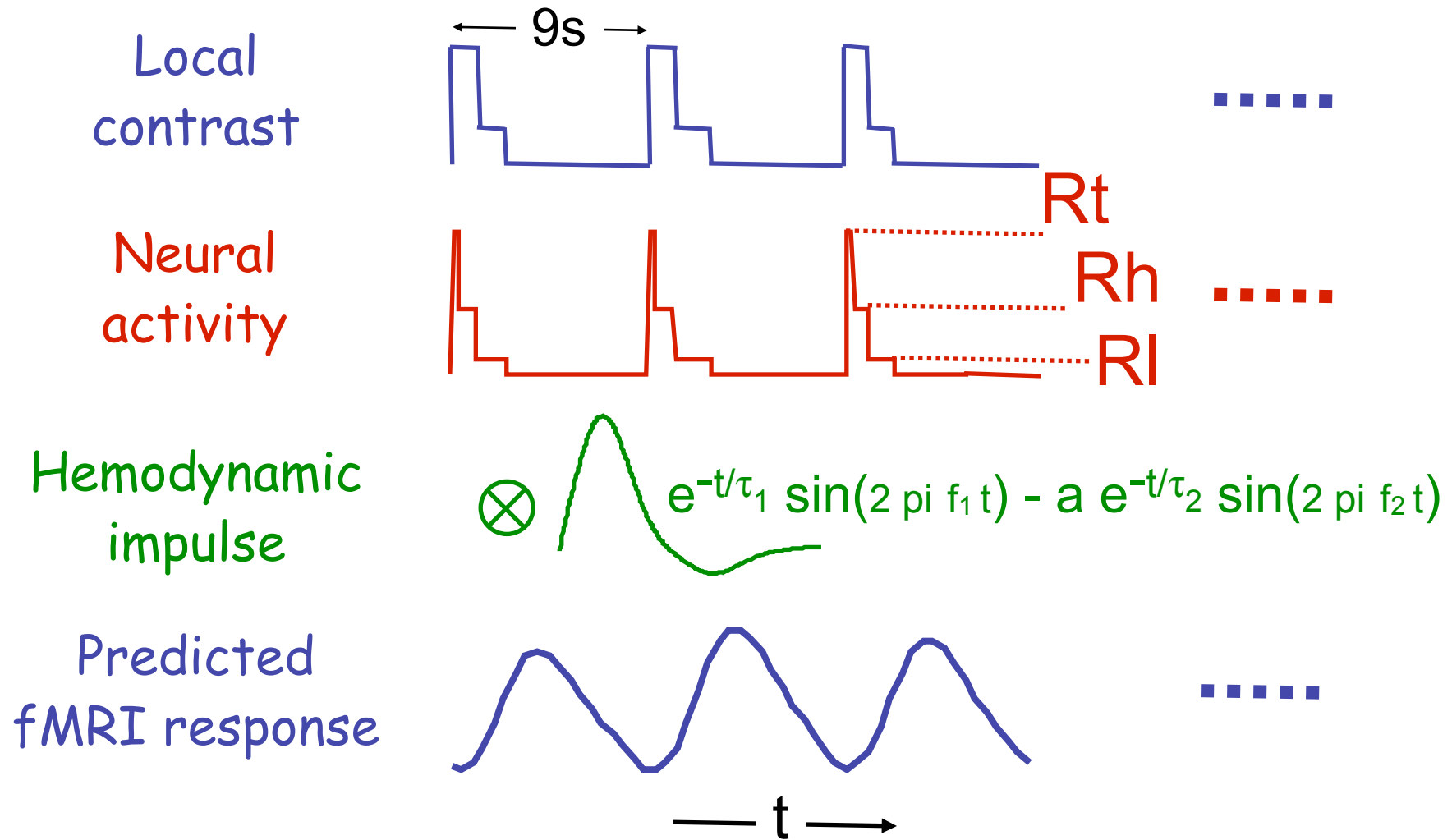


# Estimating neural activity

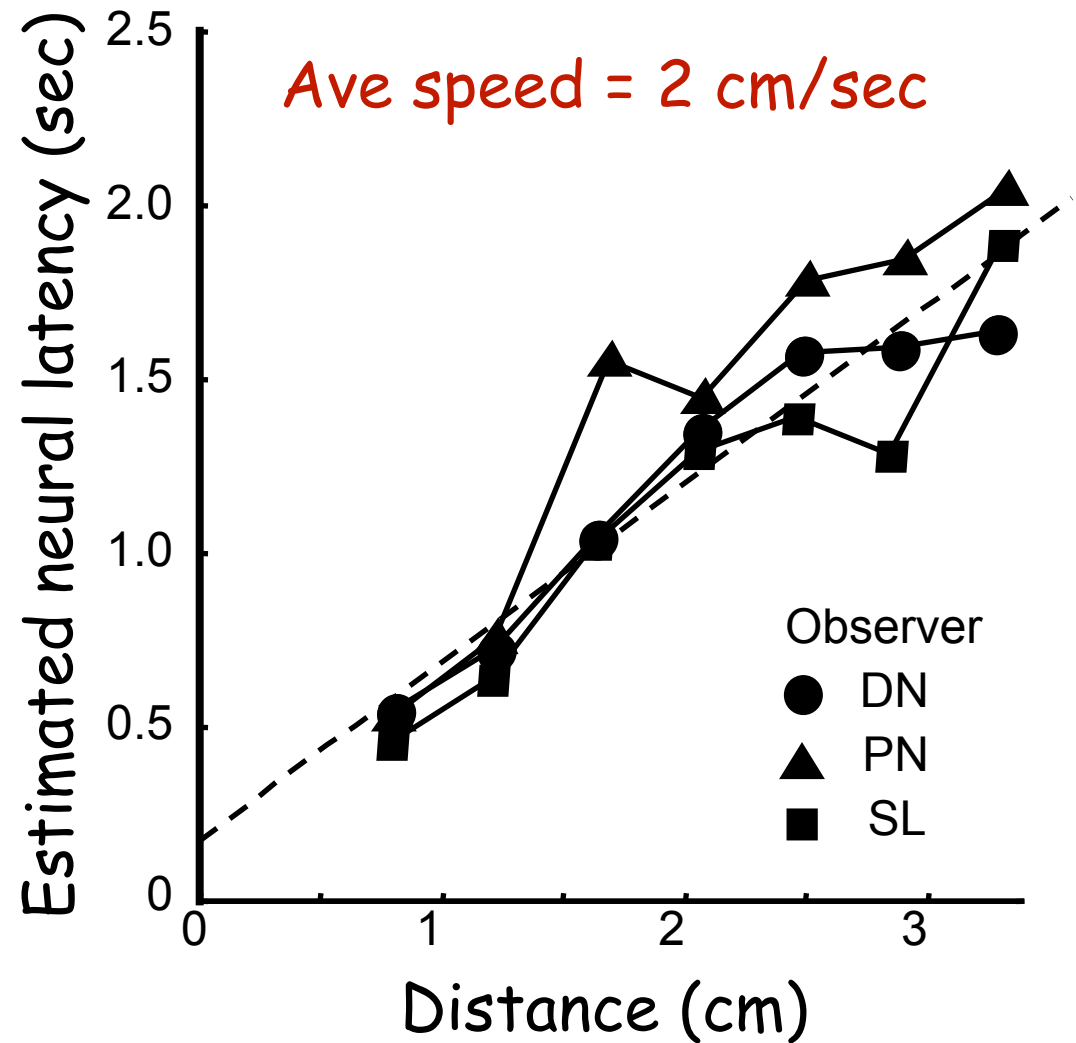
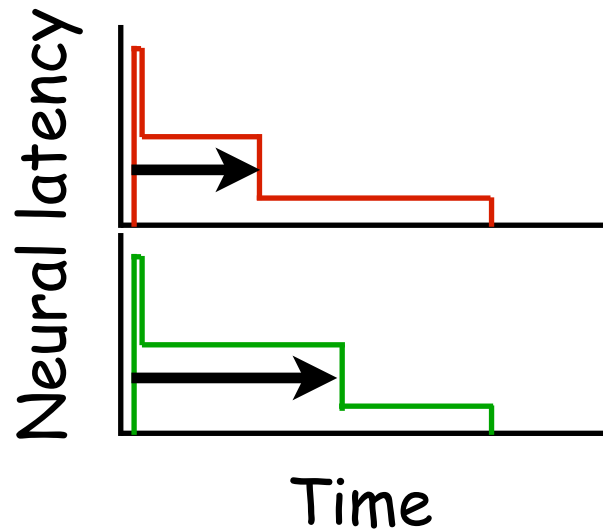




# Model of cortical activity & hemodynamic response

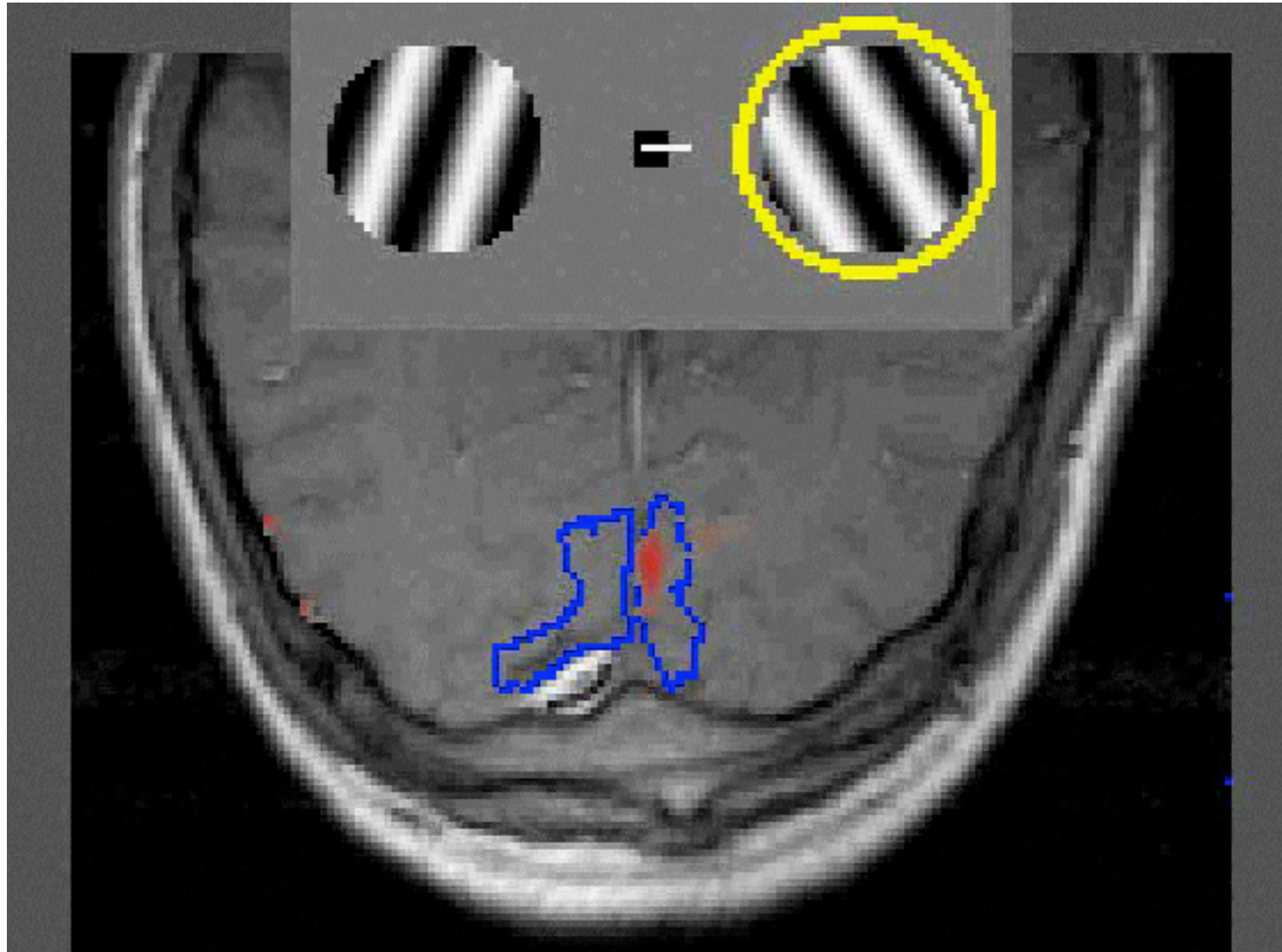


# Estimated neural latency



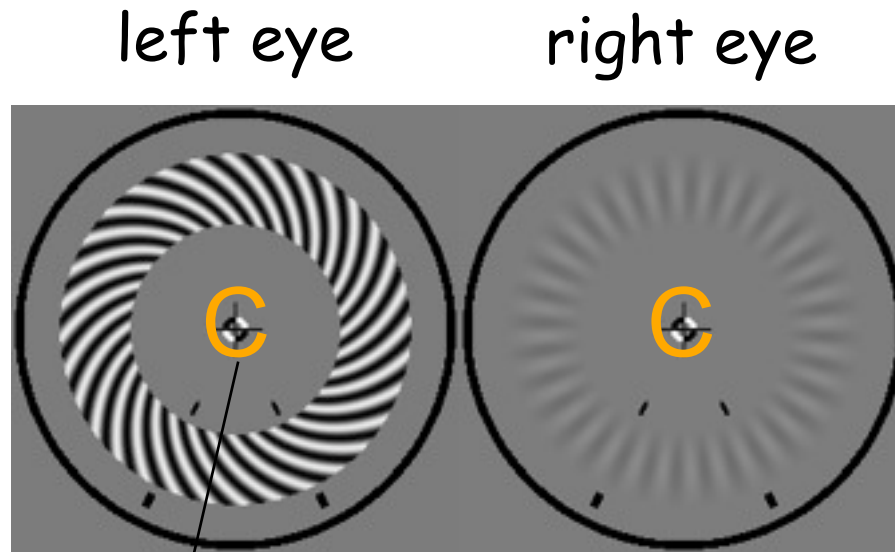
Lee, Blake, & Heeger, Nature Neurosci (2005)

# Attention signals in V1

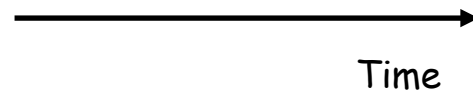


Gandhi, Heeger, & Boynton, PNAS (1999)

# Diverted attention



C2DA3B42D...

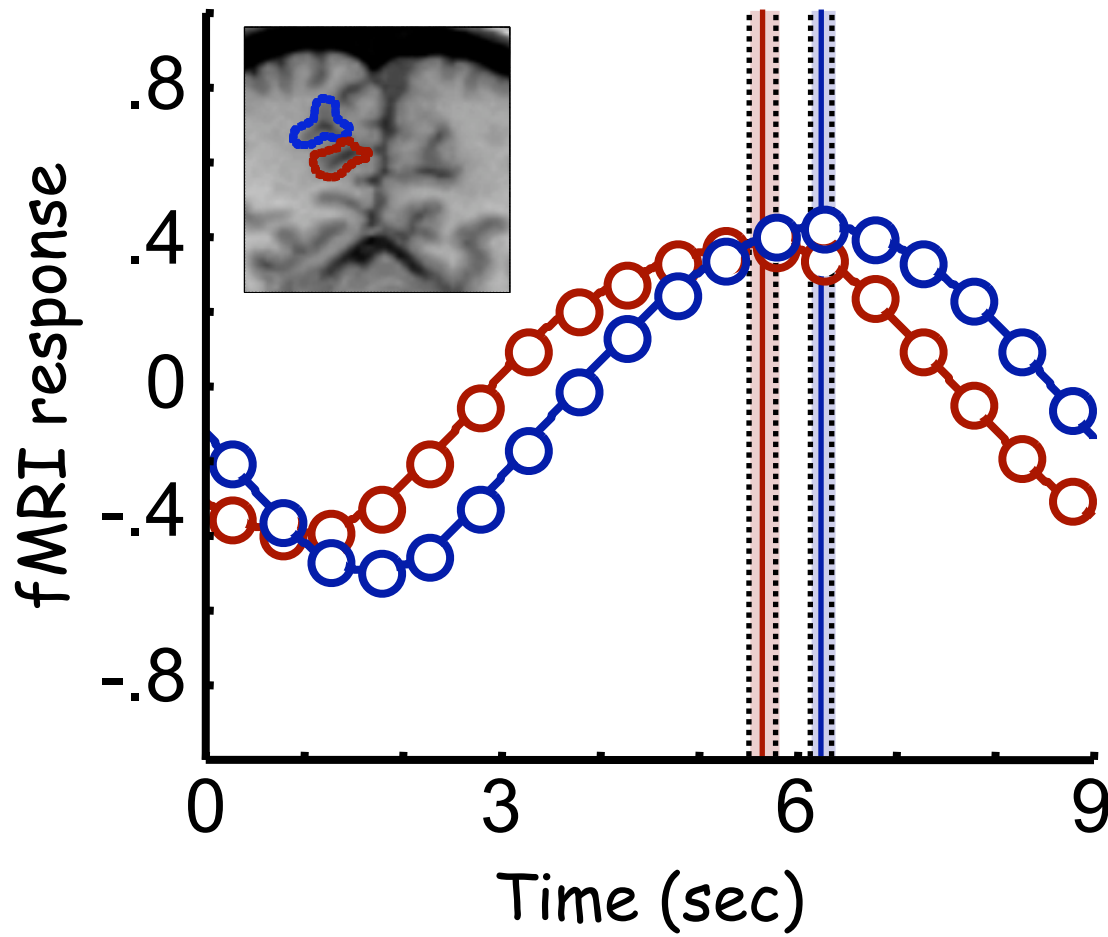
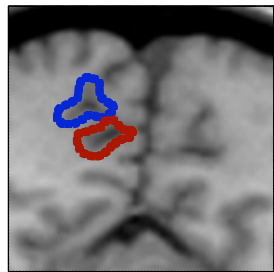


Detect repetition

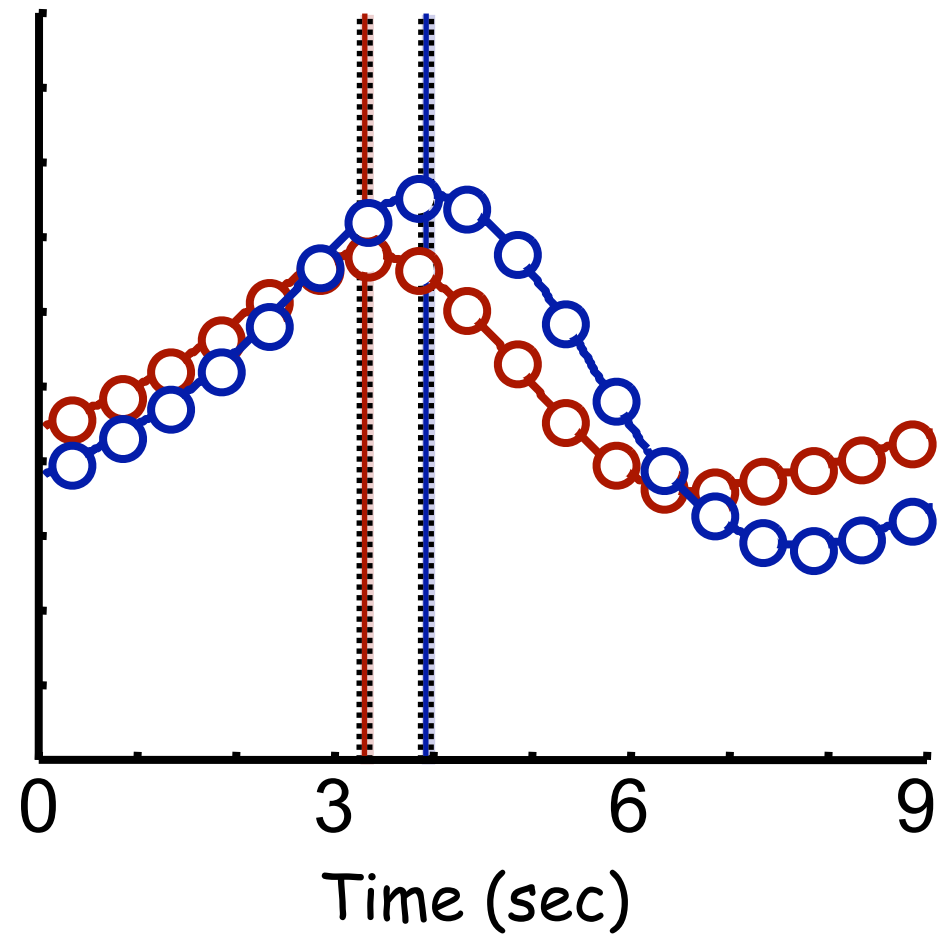
Lee, Blake, & Heeger, Nature Neurosci (2007)

# Waves in V1 without attention/perception

Rivalry (perceived)



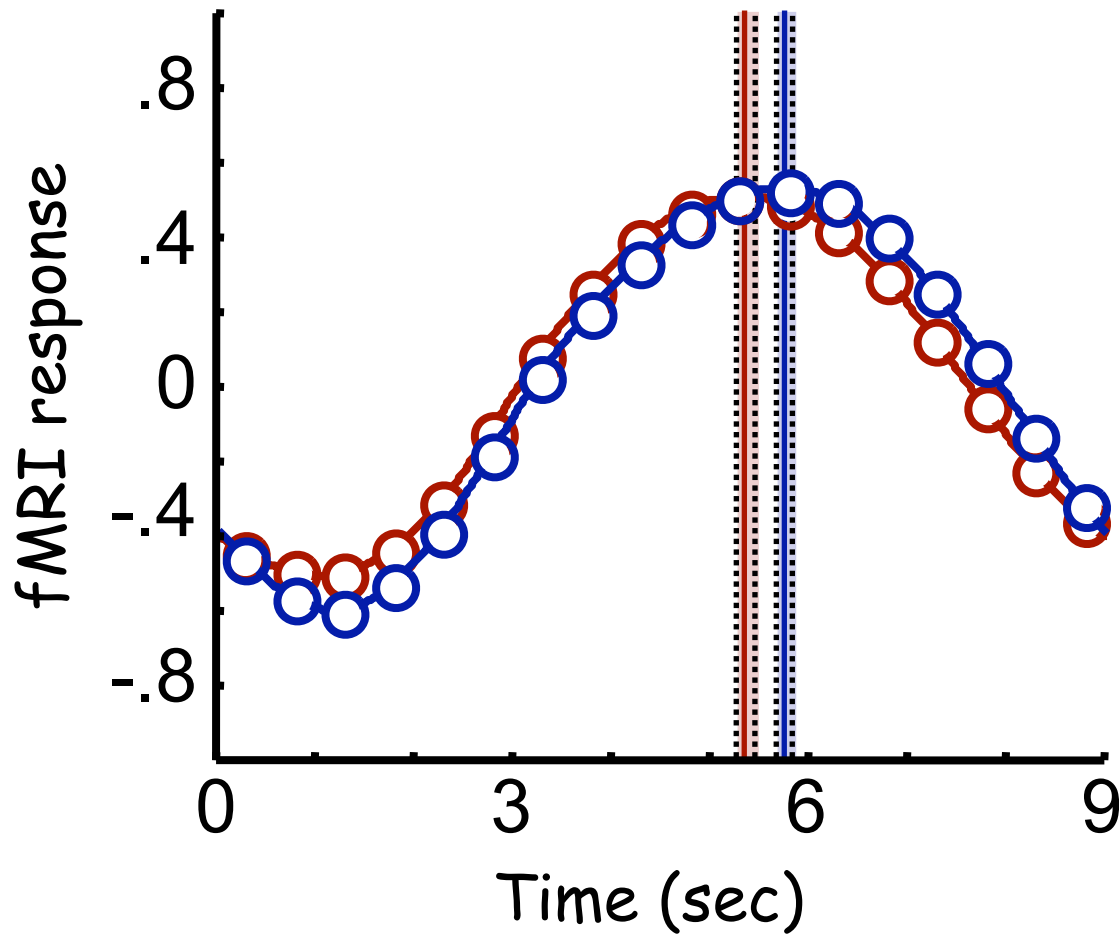
Diverted attention



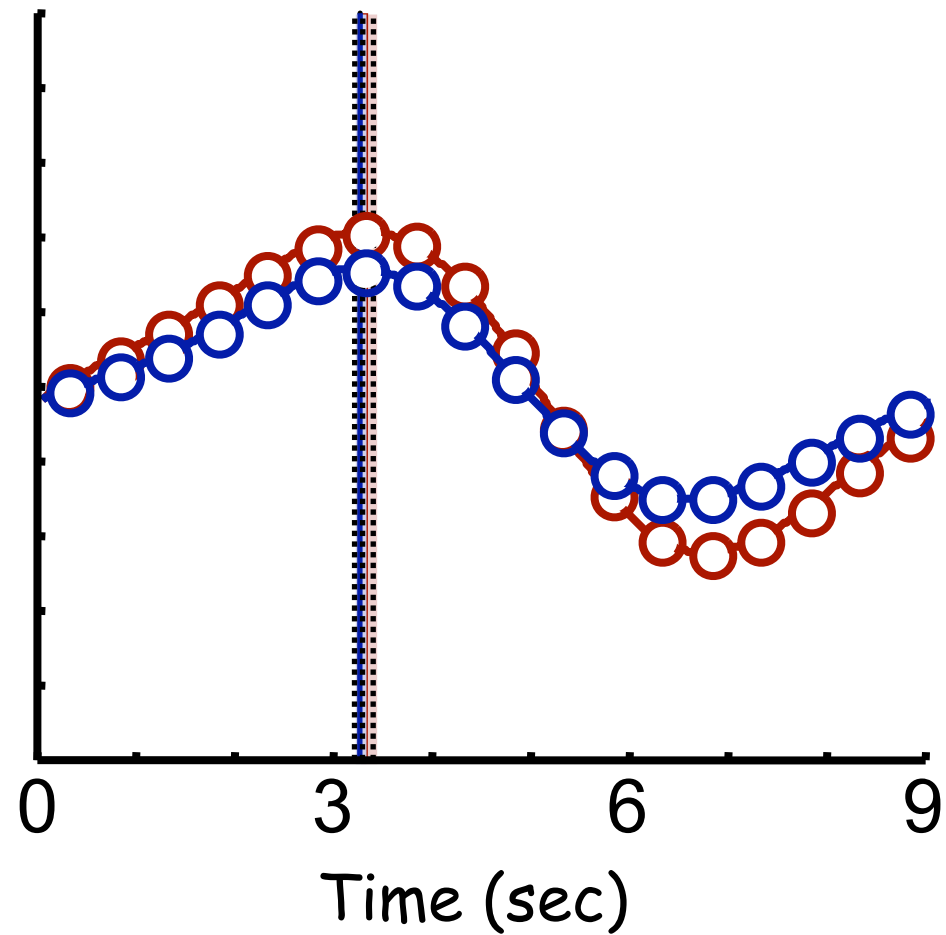
Lee, Blake, & Heeger, Nature Neurosci (2007)

# V2

## Rivalry (perceived)

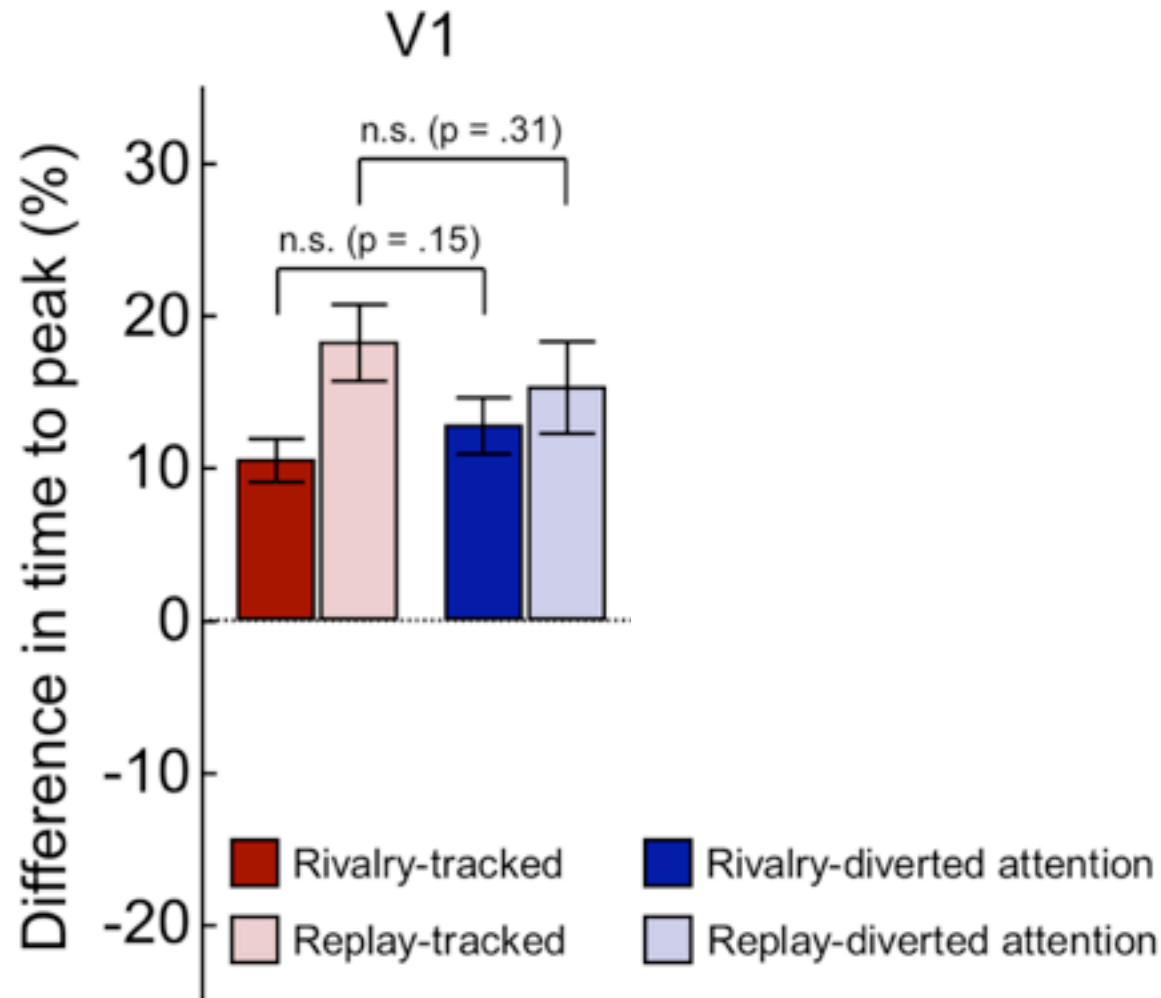


## Diverted attention



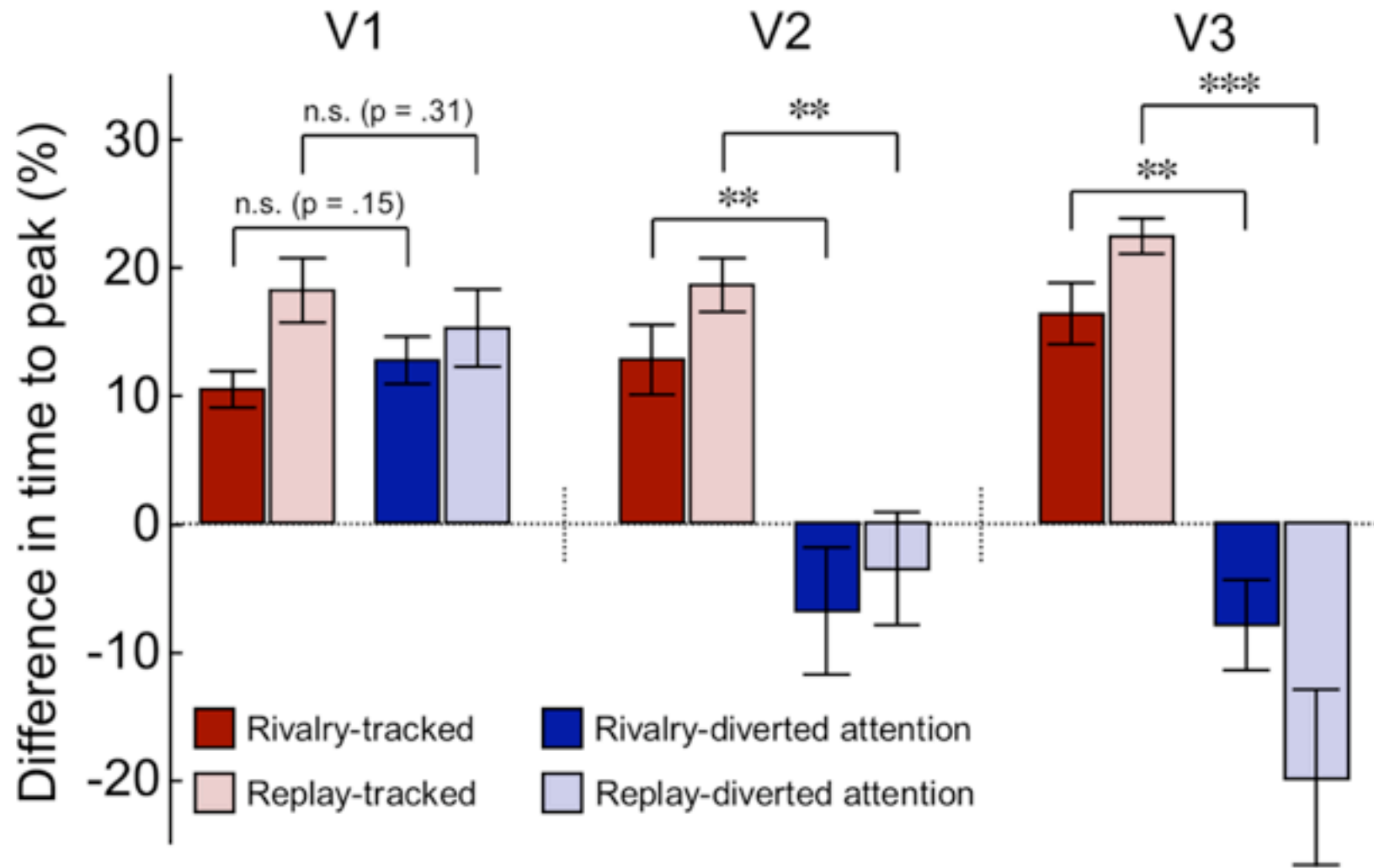
Lee, Blake, & Heeger, Nature Neurosci (2007)

# Diverting attention eliminates waves in V2 & V3



Lee, Blake, & Heeger, Nature Neurosci (2007)

# Diverting attention eliminates waves in V2 & V3

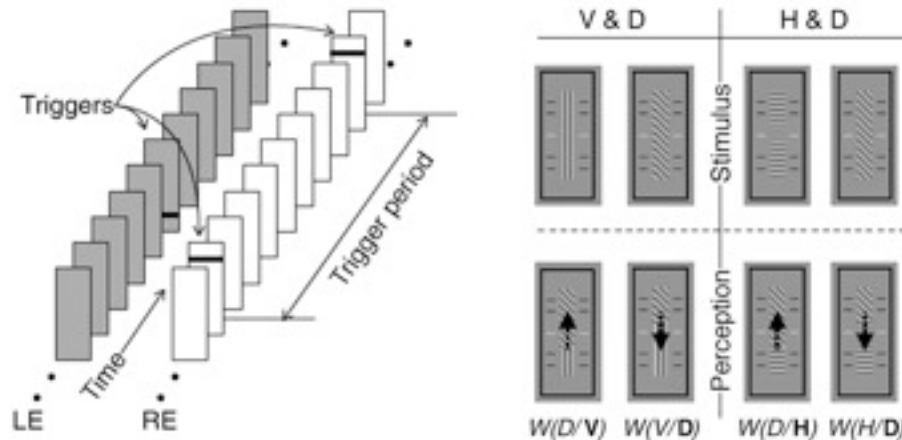


Lee, Blake, & Heeger, Nature Neurosci (2007)



# Models and testing them

## Periodic perturbation

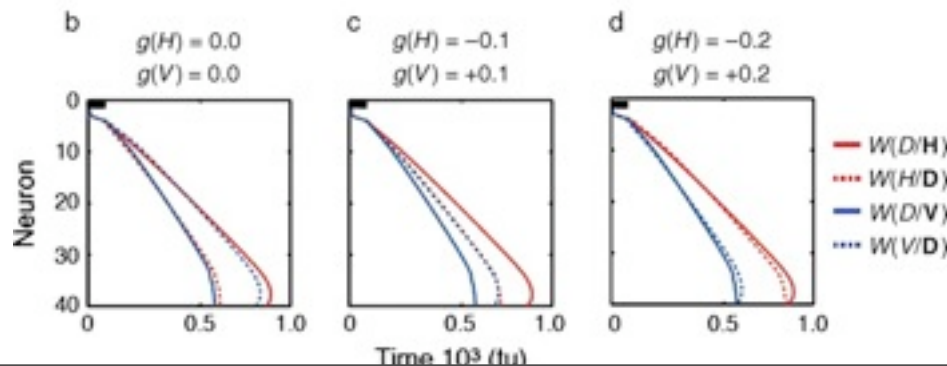
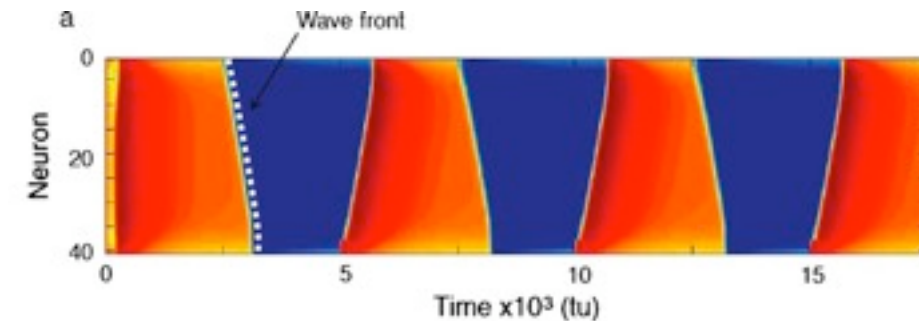


$$\tau_E \partial_t E_{Aj} = -E_{Aj} + \frac{[P_{Aj}]^2}{(10 + H_{Aj})^2 + [P_{Aj}]^2}, \quad (1)$$

$$P_{Aj} = S_{Aj} - \eta_I \sum_{k=1}^N \varphi_{Ejk} I_{Bk} + \eta_E \sum_{k=1}^N \varepsilon_{Ajk} E_{Ak}, \quad (2)$$

$$\varphi_{Ajk} = \exp\left(\frac{-(k-j)^2}{4\sigma_\varphi^2}\right), \quad (3)$$

## Simulations



$$\varepsilon_{Ajk}(X) = \exp\left(\frac{-(k-j)^2}{4\sigma_\varepsilon(X)}\right) \quad (k \neq j) \text{ in which } X \text{ is the stimulus pattern,} \quad (4)$$

$$\tau_I \partial_t I_{Aj} = -I_{Aj} + E_{Aj}, \quad (5)$$

$$\tau_H \partial_t H_{Aj} = -H_{Aj} + \eta_H \gamma_{AH} E_{Aj}, \quad (6)$$

$$\gamma_{AH} = 1 + g(X) \text{ in which } X \text{ is the stimulus pattern.} \quad (7)$$

Kang, Lee, Kim, Heeger, Blake, J Vis, 2010

# Part I summary

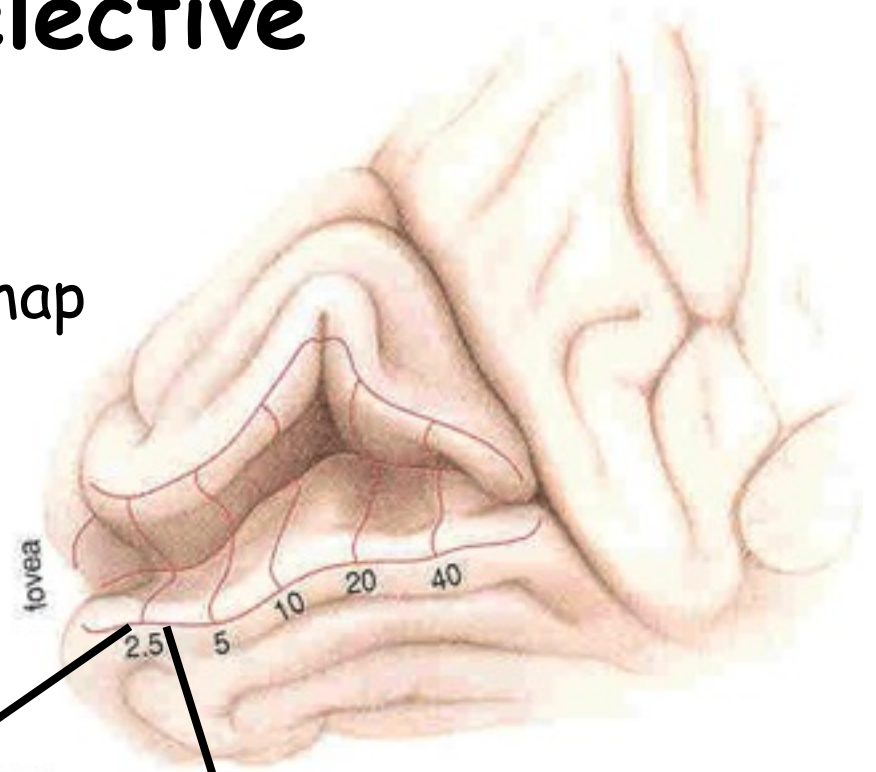
- V1 activity correlated with spatio-temporal dynamics of perceptual waves during binocular rivalry.
- The velocity of neural waves in V1 matched the latency of perceptual waves.
- Neural waves in V1 were still present when attention was diverted, but weaker in amplitude and faster in velocity.
- V2 and V3 exhibited cortical waves of activity during rivalry but the waves were eliminated when attention was diverted.

# Implications

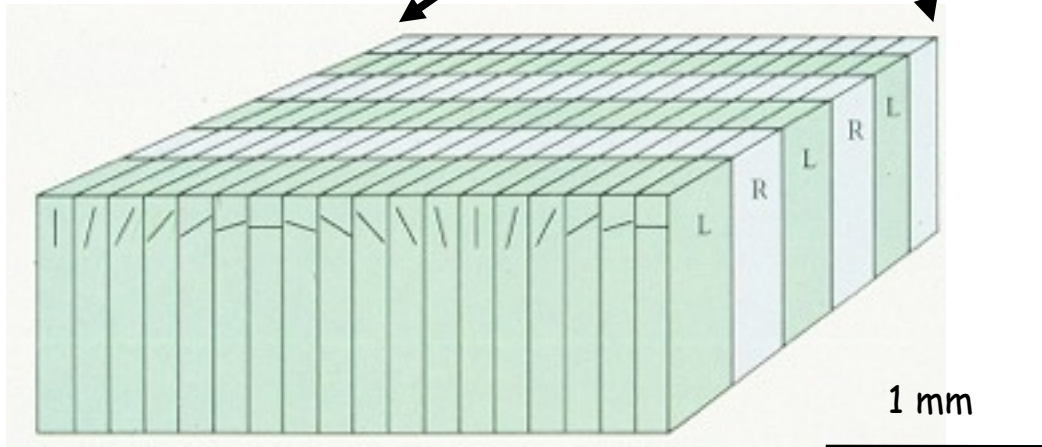
- Neural wave propagation is intrinsic to V1.
- Constrains models of processing and circuitry in V1 (waves are slow relative to action potential propagation and synaptic transmission).

# Part II: Spatial resolution & measuring activity in selective subpopulations

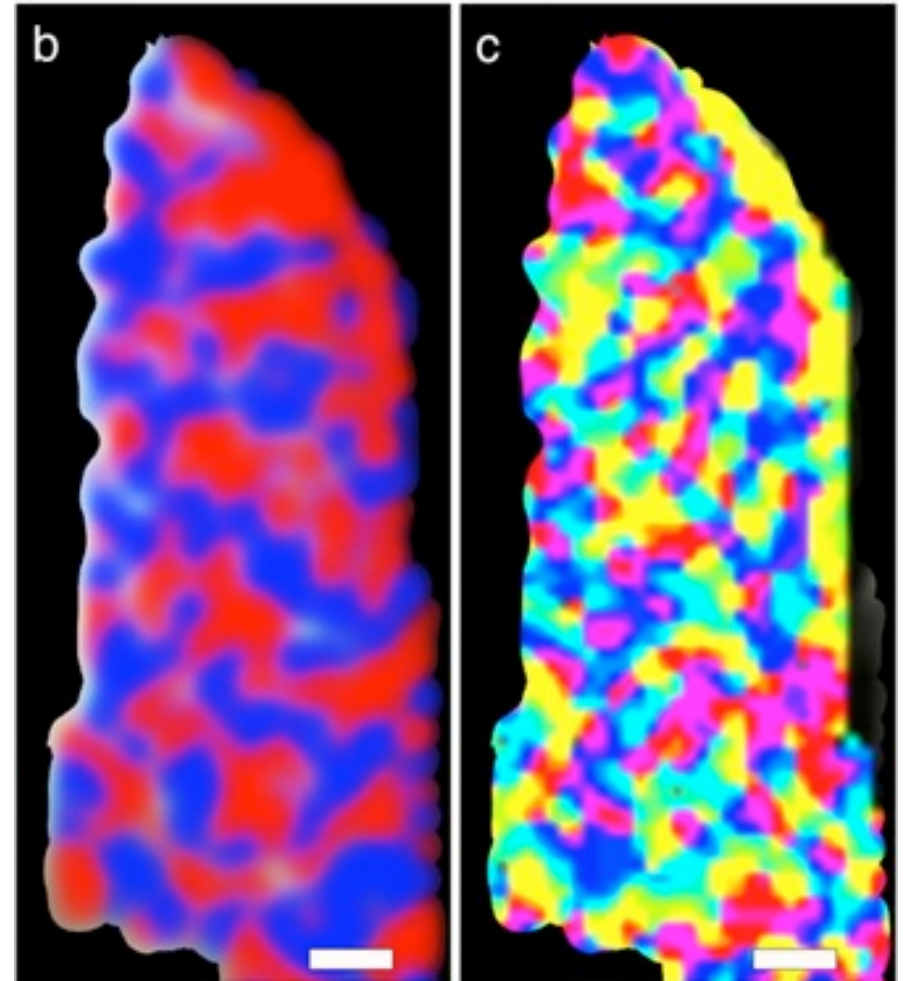
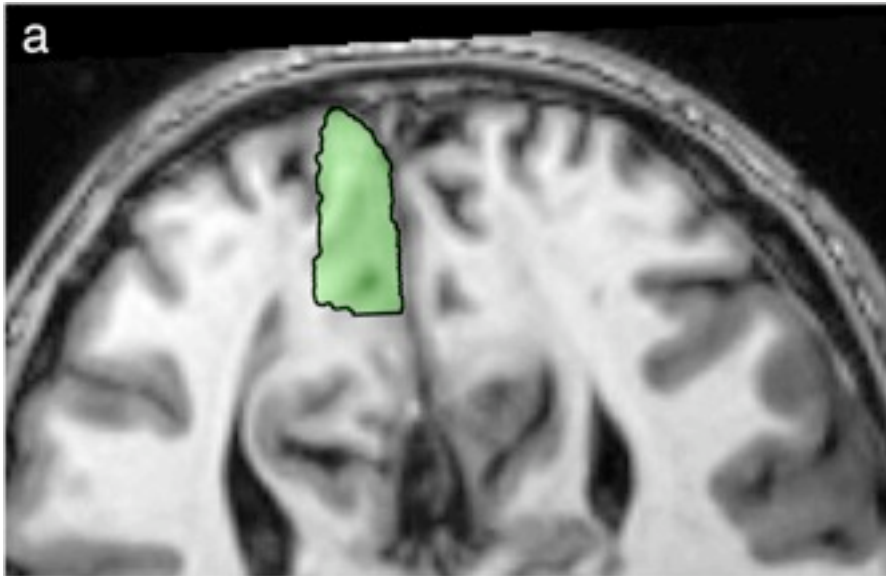
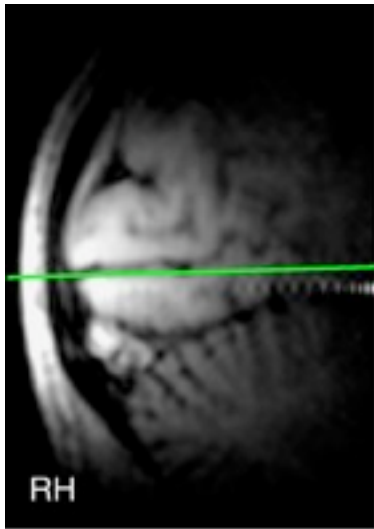
Retinotopic map



Columnar architecture



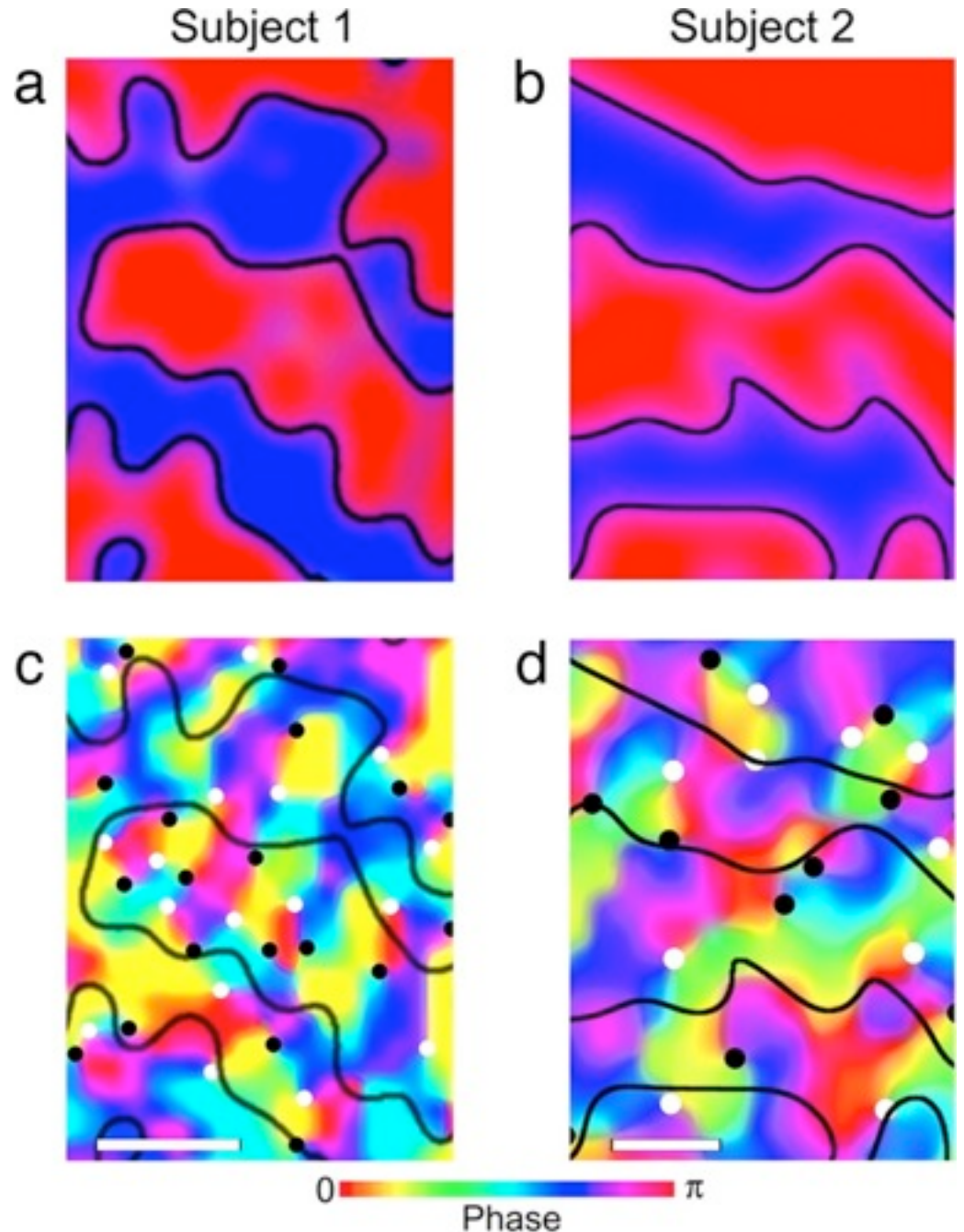
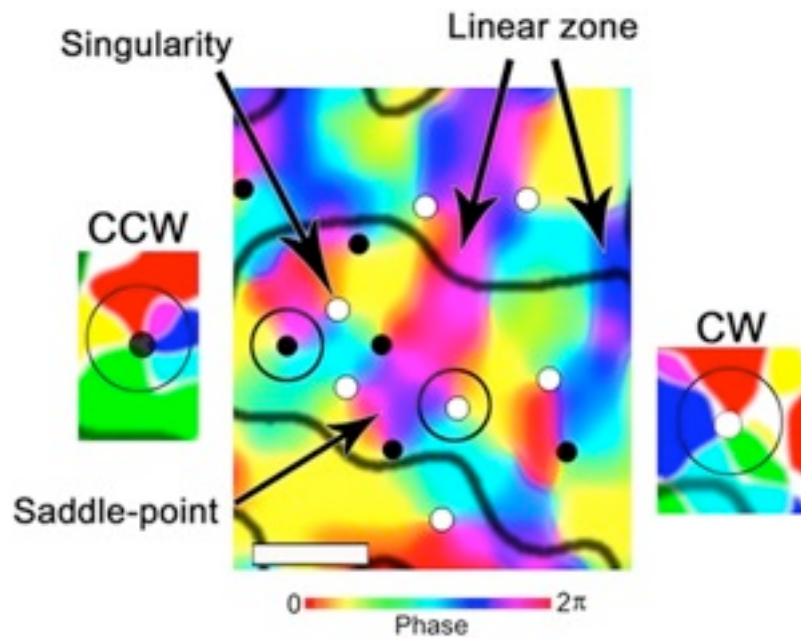
# Human ocular dominance and orientation columns



Yacoub, Harel, Ugurbil, PNAS (2008)

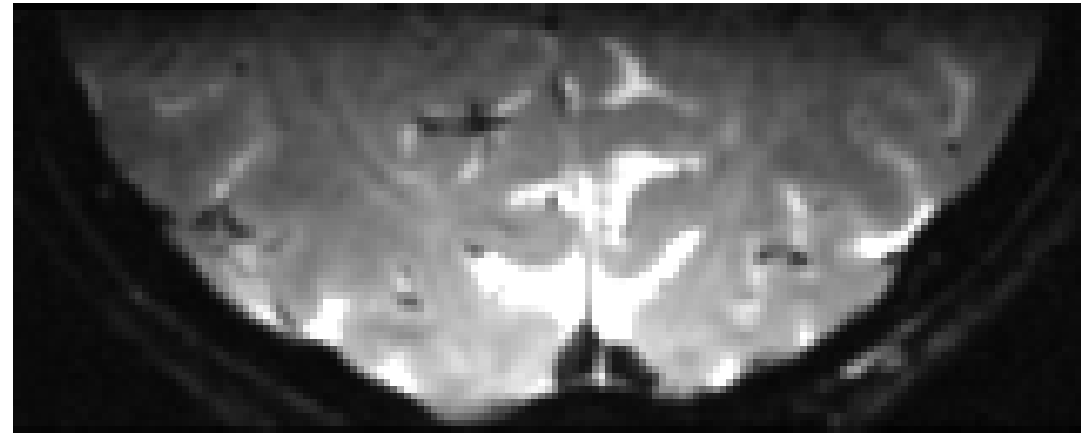
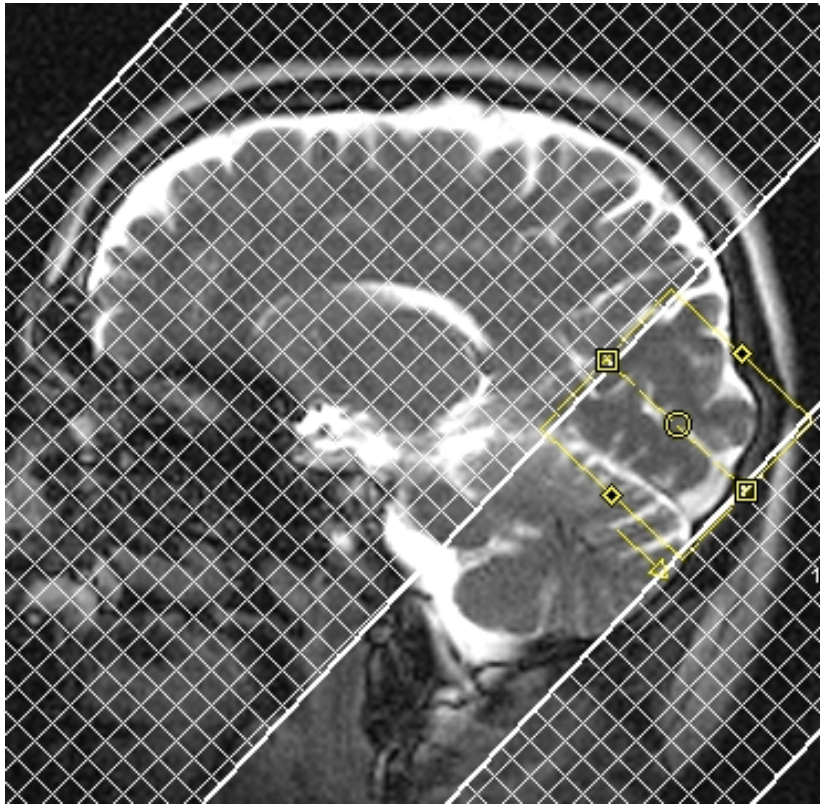


# Human ocular dominance and orientation columns



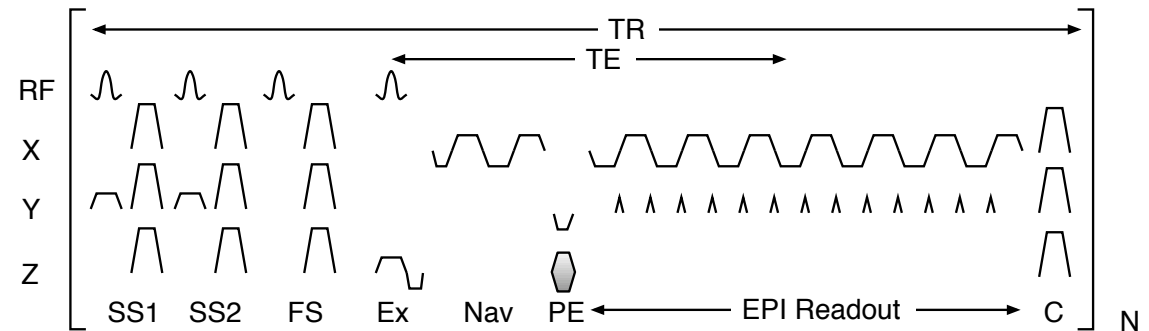
Yacoub, Harel, Ugurbil, PNAS (2008)

# High resolution fMRI acquisition



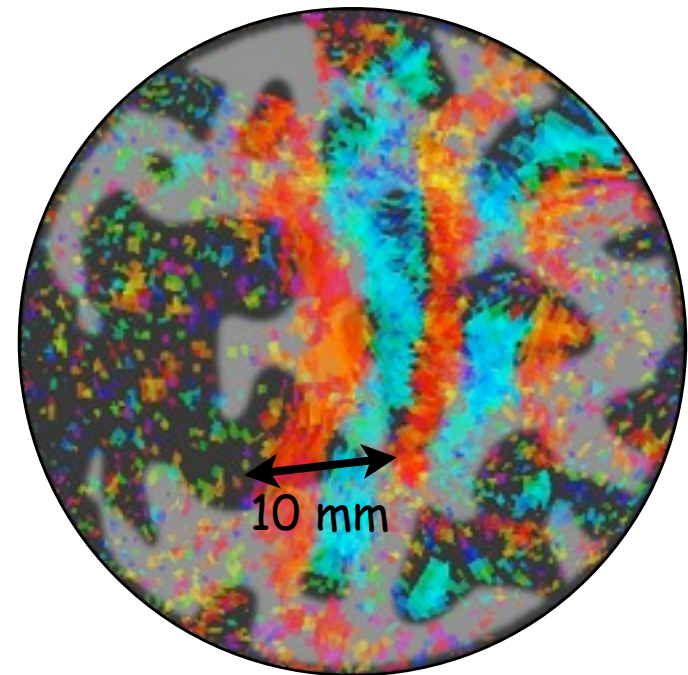
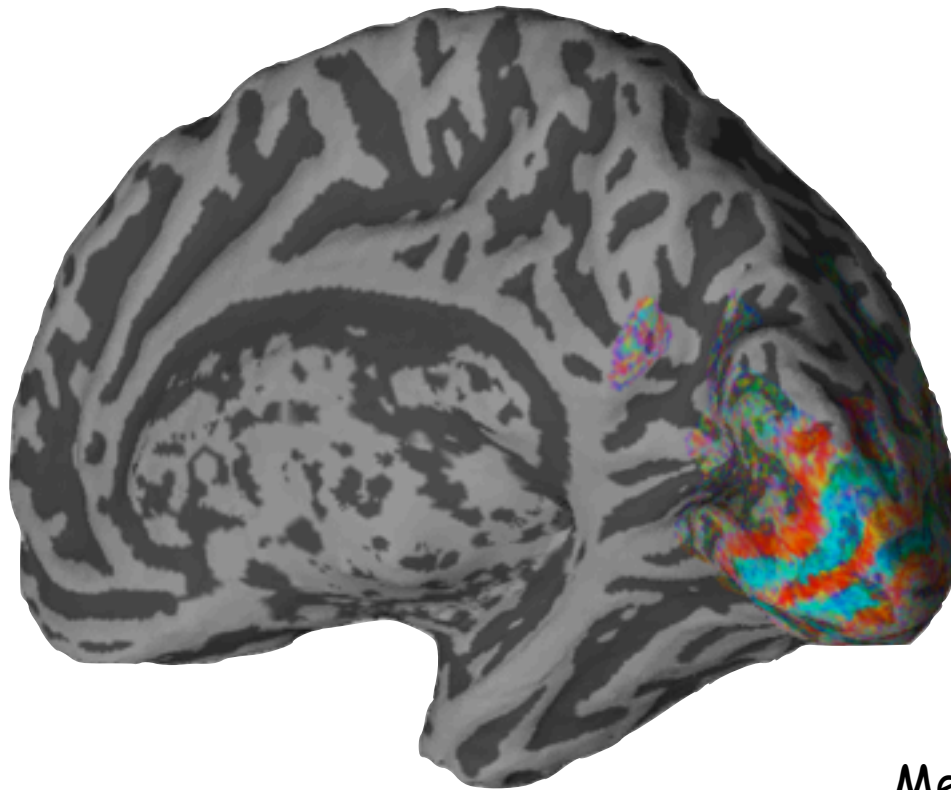
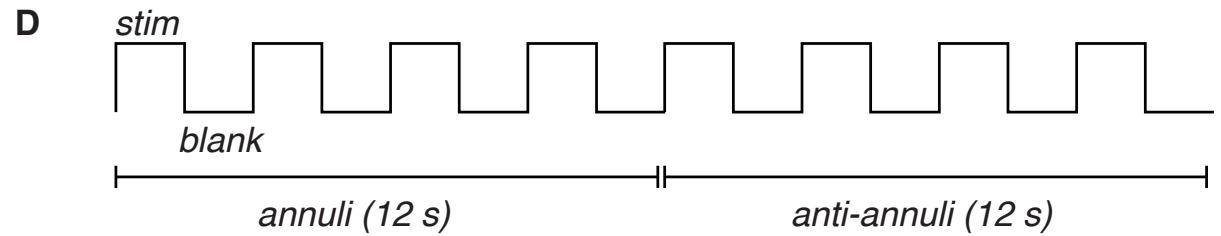
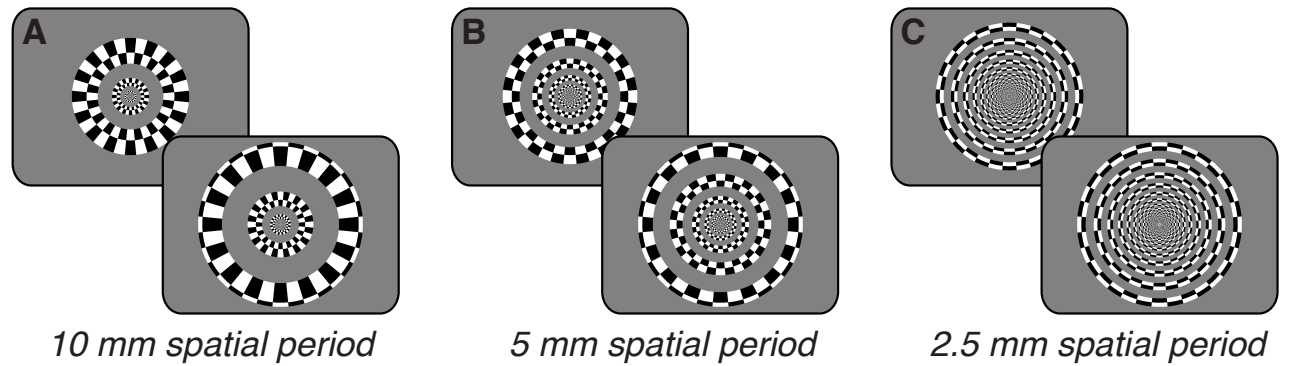
0.75 x 0.75 x 0.75 mm

Gradient-recalled echo (GRE) pulse sequence with outer volume suppression.



Merriam, Schluppeck, Heeger, et al, SfN (2010)

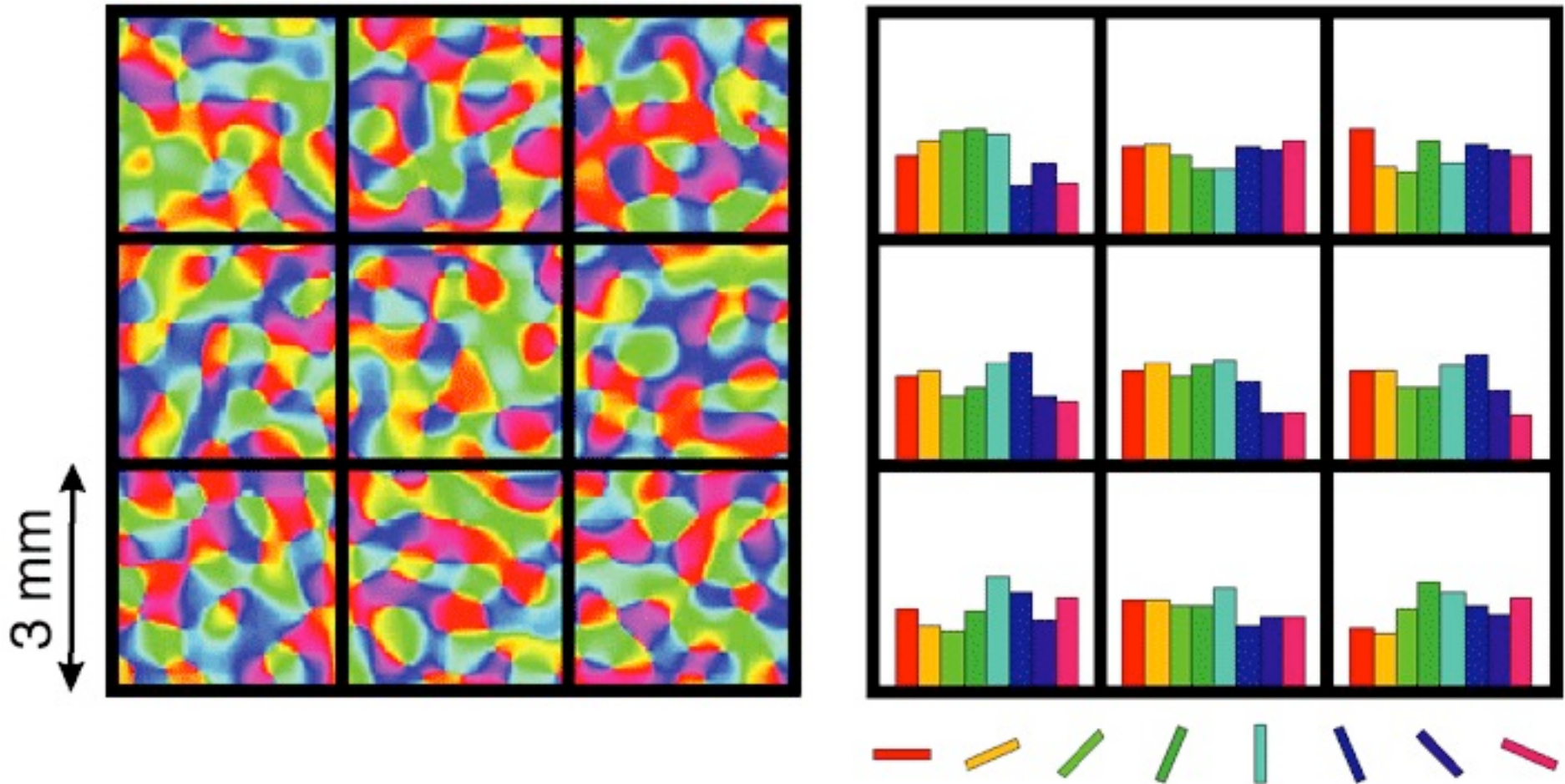
# Spatial resolution protocol



Merriam, Schluppeck, Heeger, et al, SfN (2010)

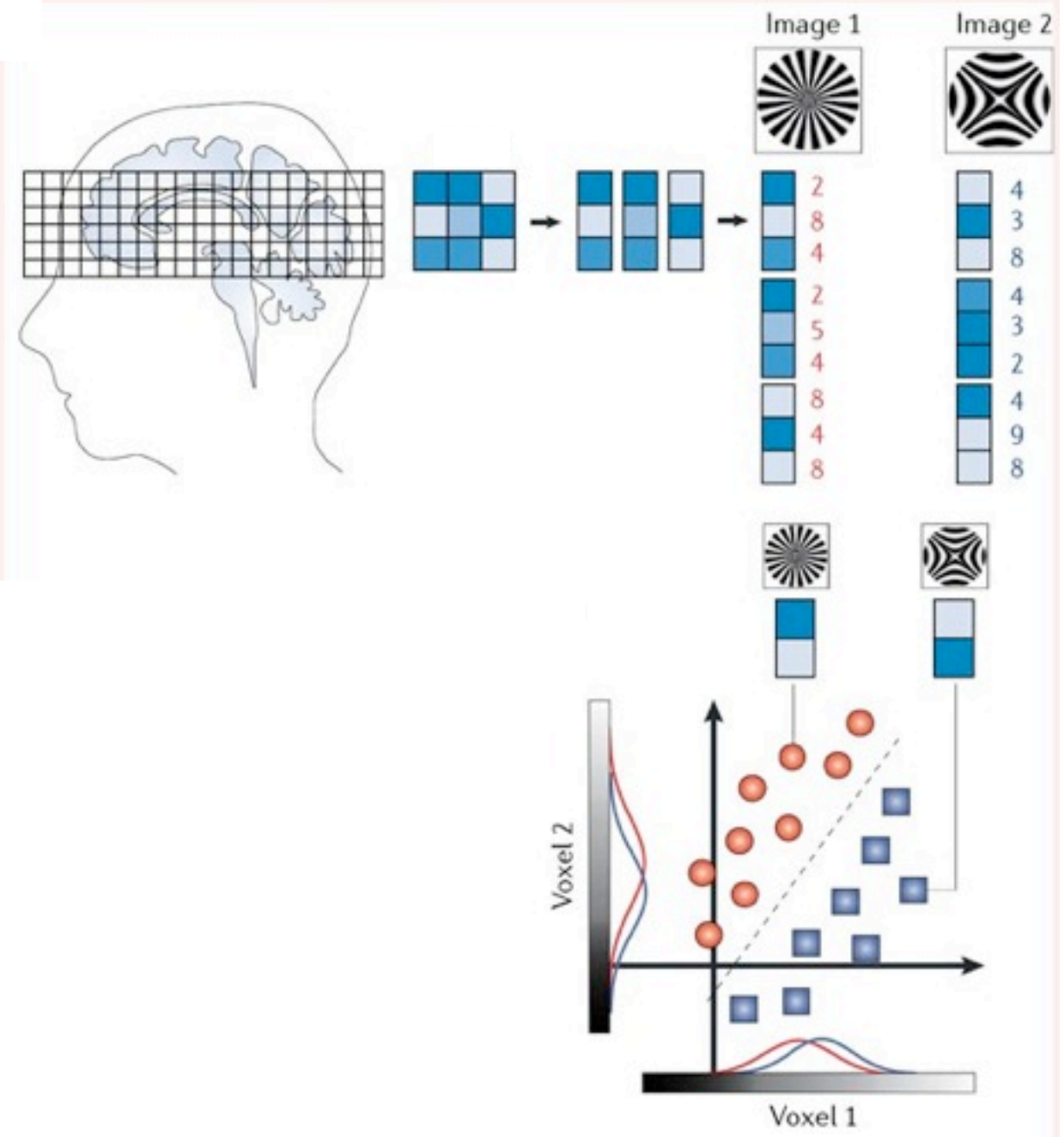


# Orientation decoding

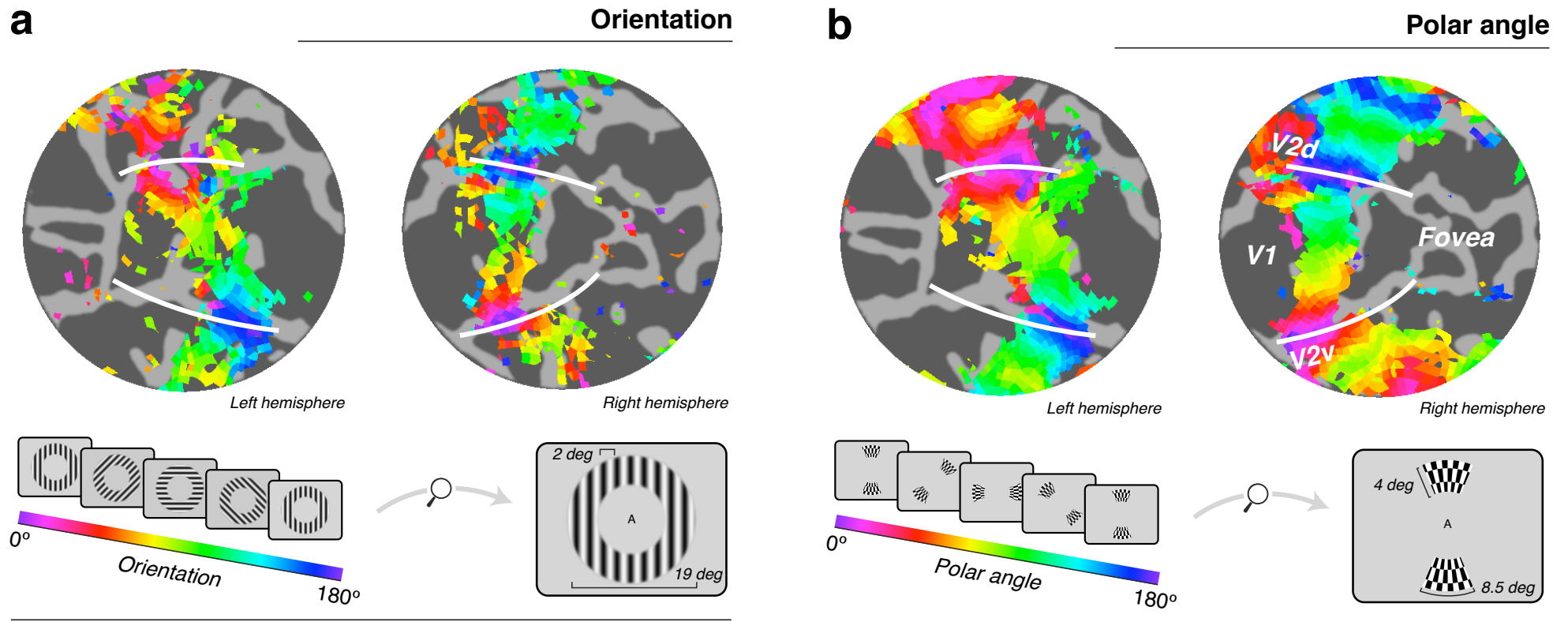


Boynton, Nat Neurosci (2008)  
following Kamitani & Tong, Nat Neurosci (2008)

# Linear discriminant analysis

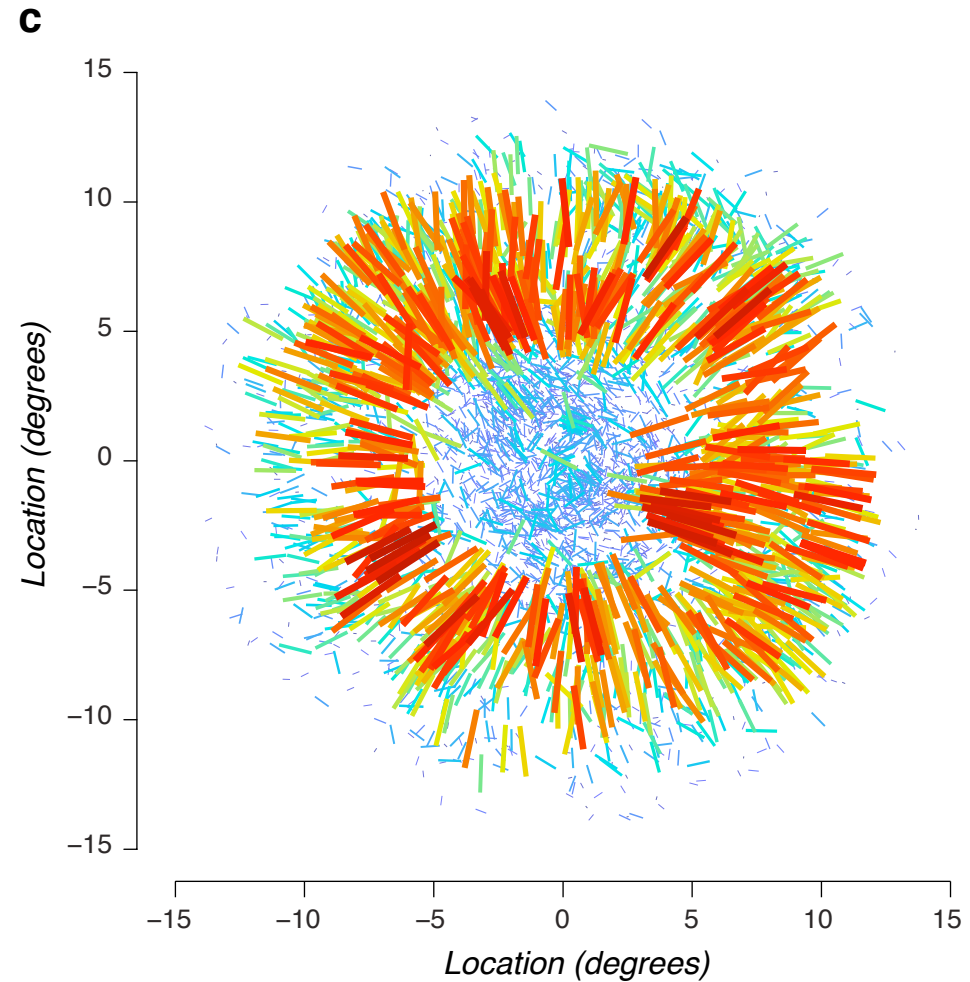
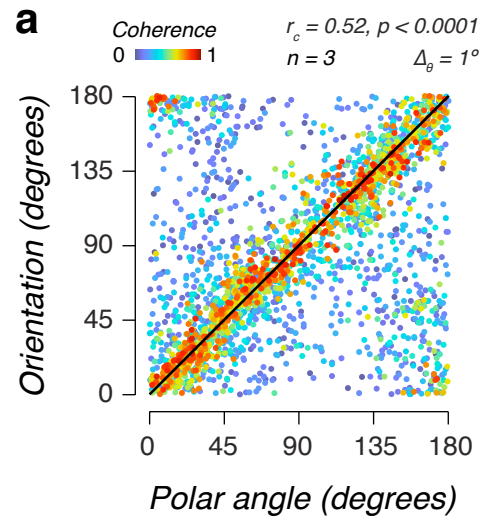


# Orientation map matches polar-angle map



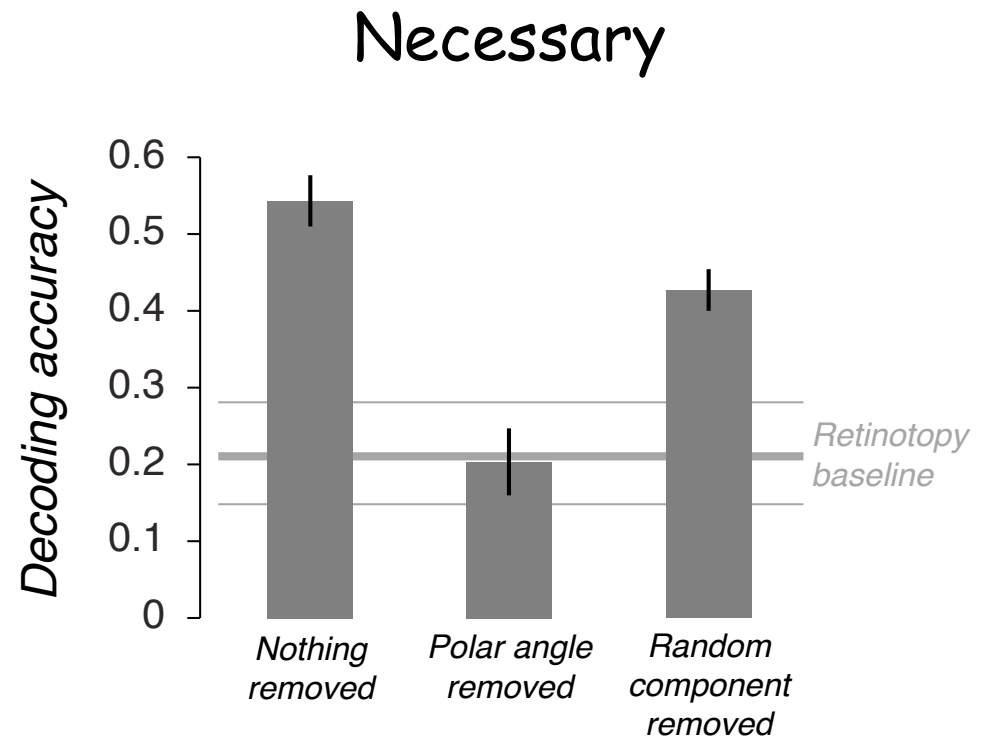
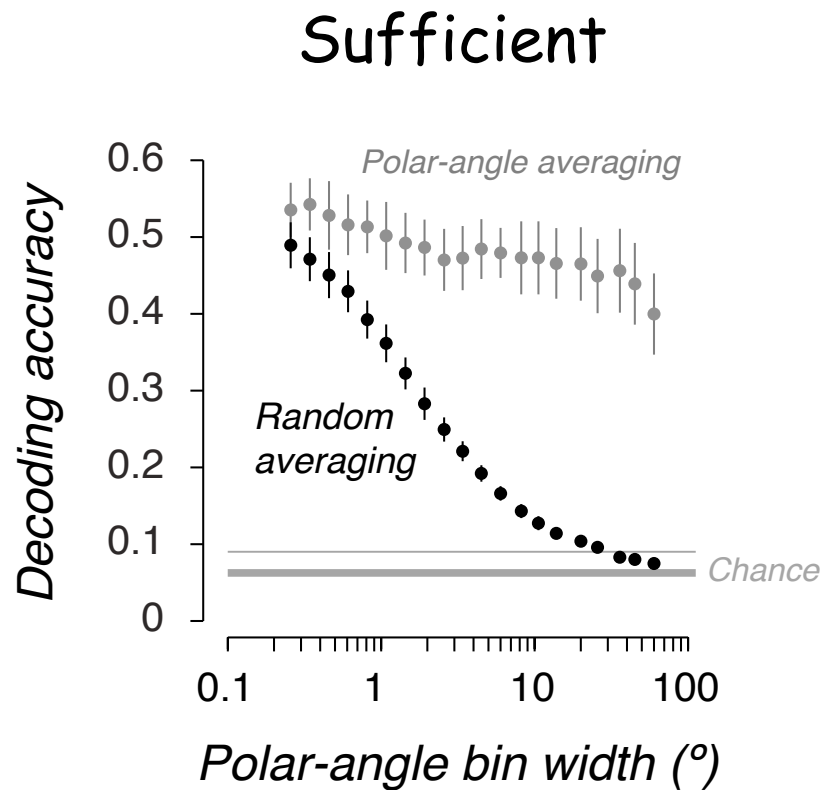
Freeman, Brouwer, Heeger, Merriam, SfN (2010)

# Orientation map matches polar-angle map



Freeman, Brouwer, Heeger, Merriam, SfN (2010)

# Orientation map is necessary and sufficient for decoding



Freeman, Brouwer, Heeger, Merriam, SfN (2010)

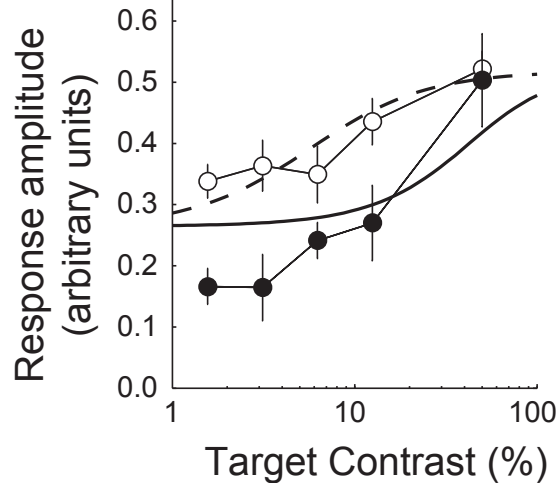
# Normalization in human V1

Target only

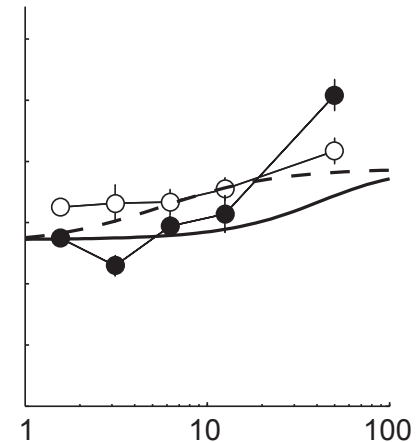
Target + mask



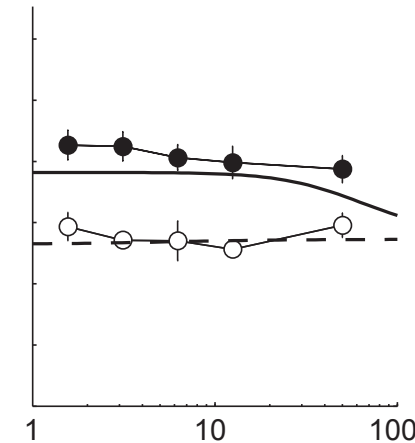
Channel tuned to target orientation



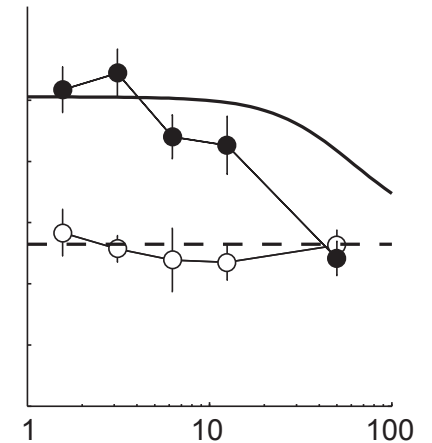
Channel tuned to  $\pm 30$  deg from target orientation



Channel tuned to  $\pm 60$  deg from target orientation



Channel tuned to mask orientation



○ Target only

● Target + mask

— Best fitting model (target only)

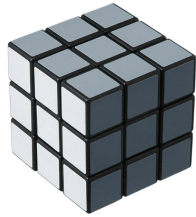
- - - Best fitting model (target + mask)

Brouwer & Heeger, Cosyne (2010)



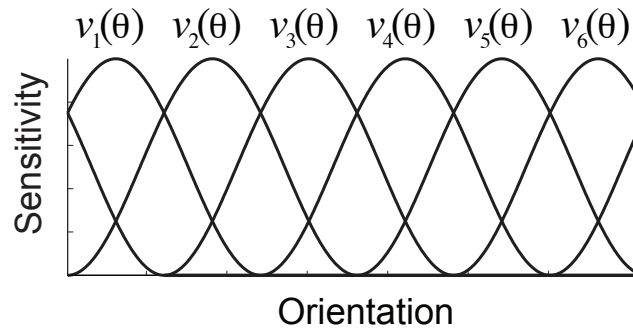
# Forward model

Voxel responses



$$y_j = \sum_i w_{ij} x_i$$

Orientation tuning model



$$\mathbf{Y} = \mathbf{W} \mathbf{X}$$

Measure weight matrix using full-contrast oriented gratings:



Then for main expt, use inverse of  $\mathbf{W}$  to estimate  $\mathbf{X}$  from  $\mathbf{Y}$ .

Brouwer & Heeger, Cosyne (2010)



# Part II summary

**Goal:** measure activity in separate subpopulations of neurons that respond selectively to different features.

- Columnar scale spatial resolution is achievable but not routine.
- Coarse scale radial bias explains orientation decoding/classification, not random sampling of fine-scale columnar architecture.
- Forward model and regression transforms voxel responses to selective "channel" responses.

# Collaborators

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