

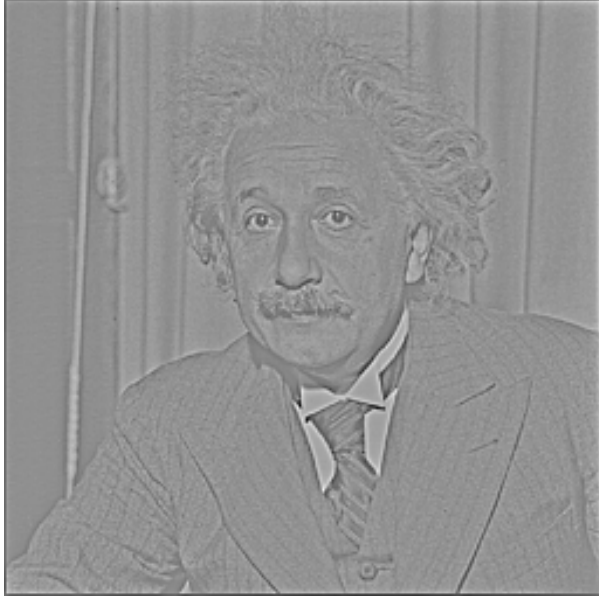
# Open questions from last week

- What have studies using simple test stimuli taught us about the responses of visual neurons to natural images?
- What is the luminance and contrast distribution of natural scenes?
- What do deviations from  $1/f$  say about the scale or 'gist' of a scene? What about time-varying images?

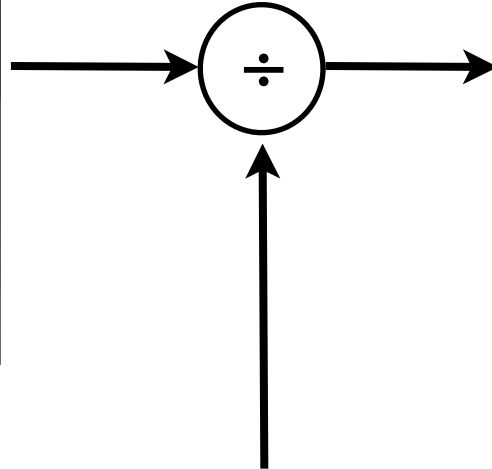
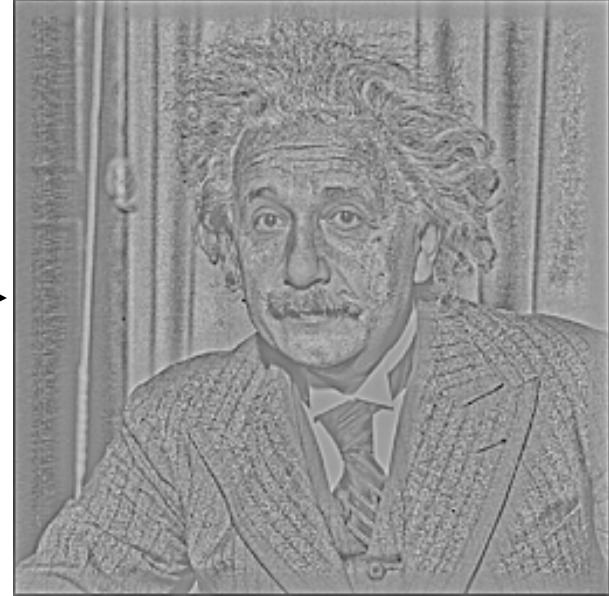
# Open questions from last week

- Does the retina/LGN really whiten natural images? What happens at D.C. and low spatial-frequencies?
- How to employ contrast normalization as a coding strategy?

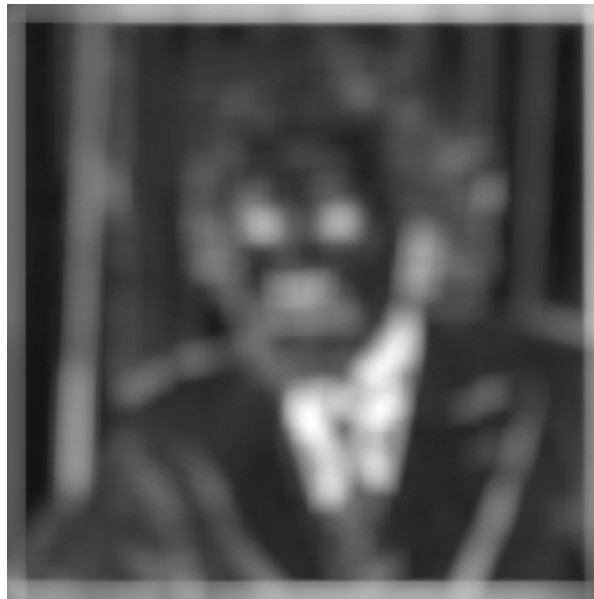
whitened image

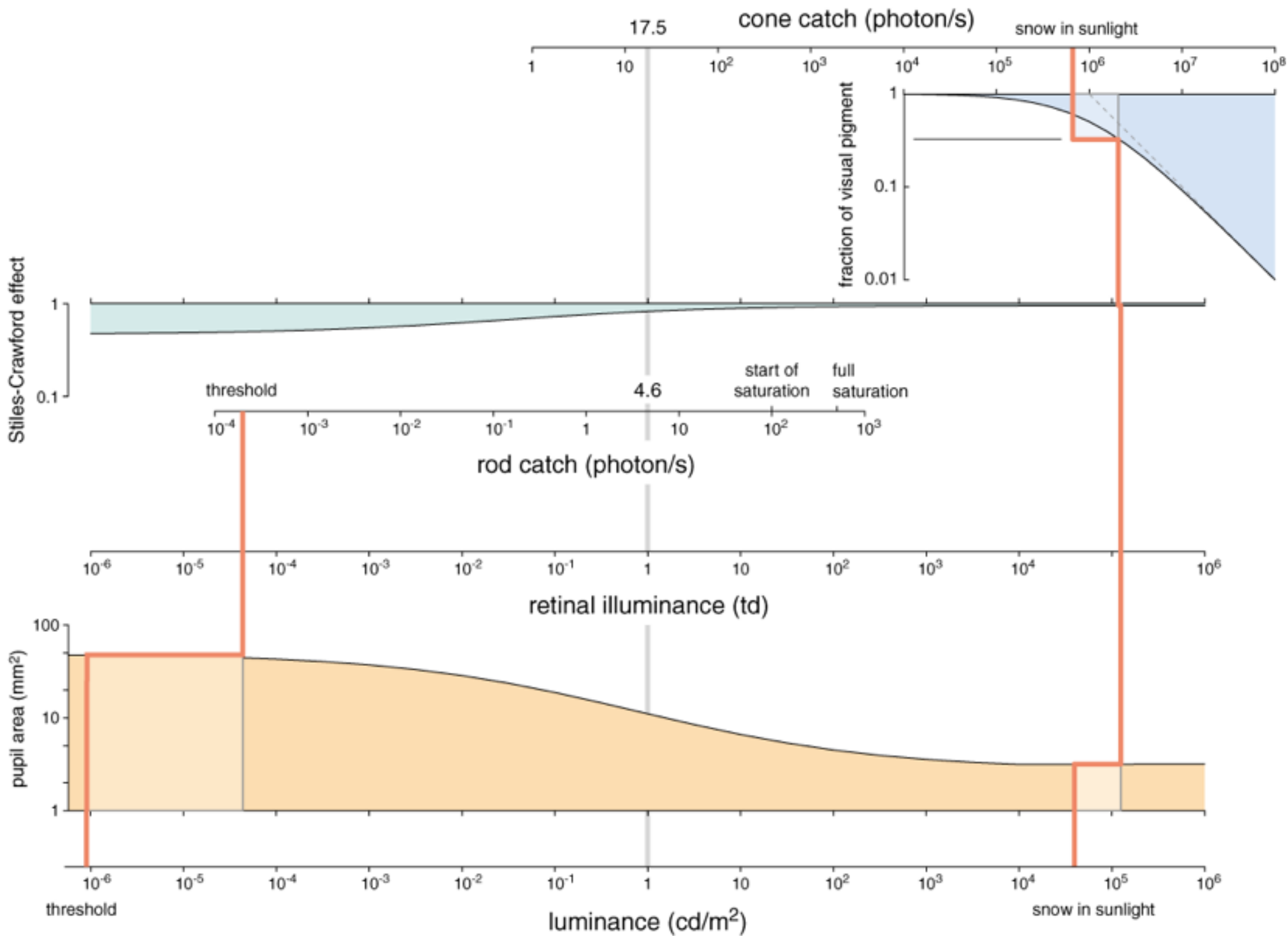


contrast normalized  
image

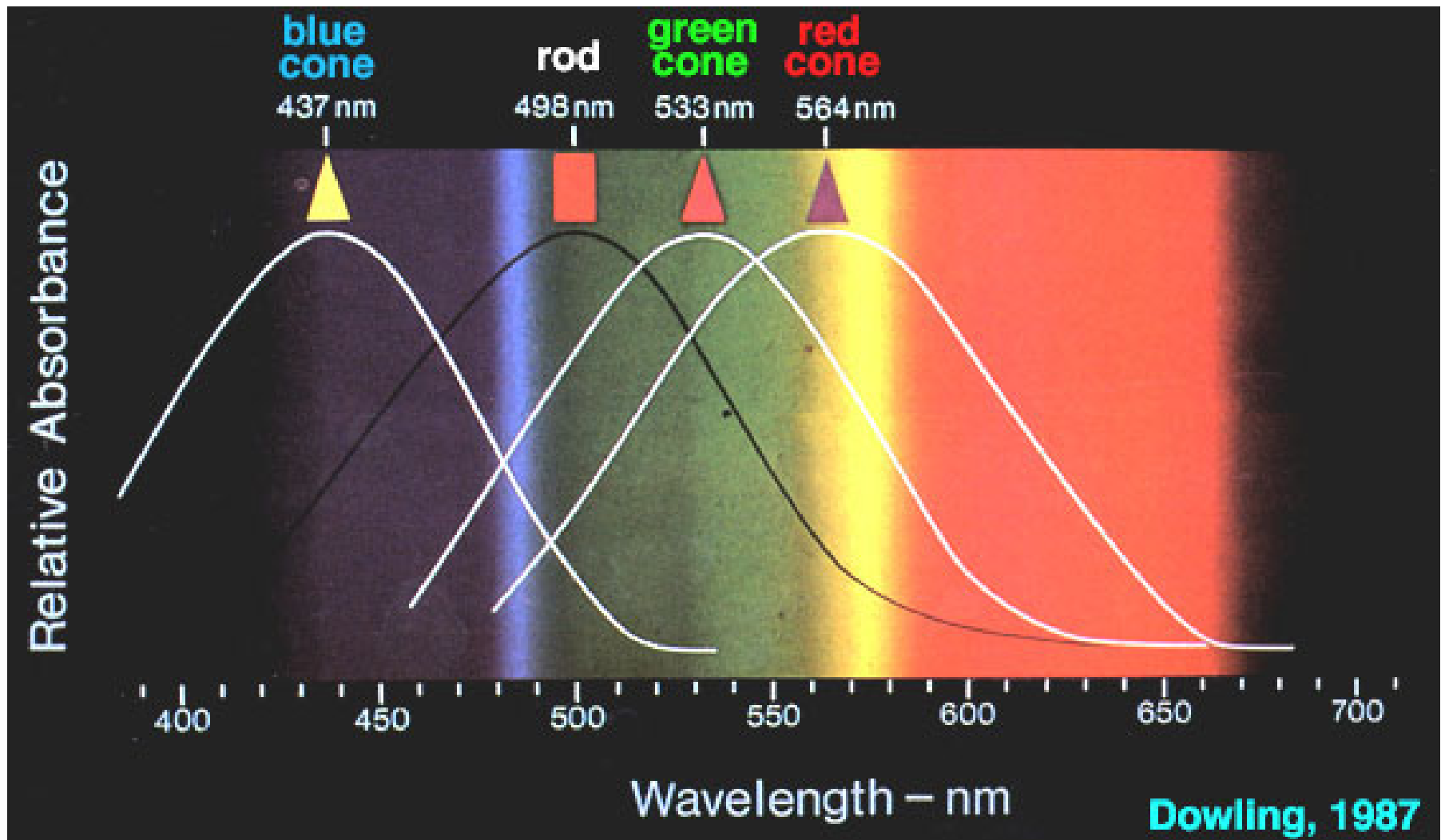


local rms  
contrast



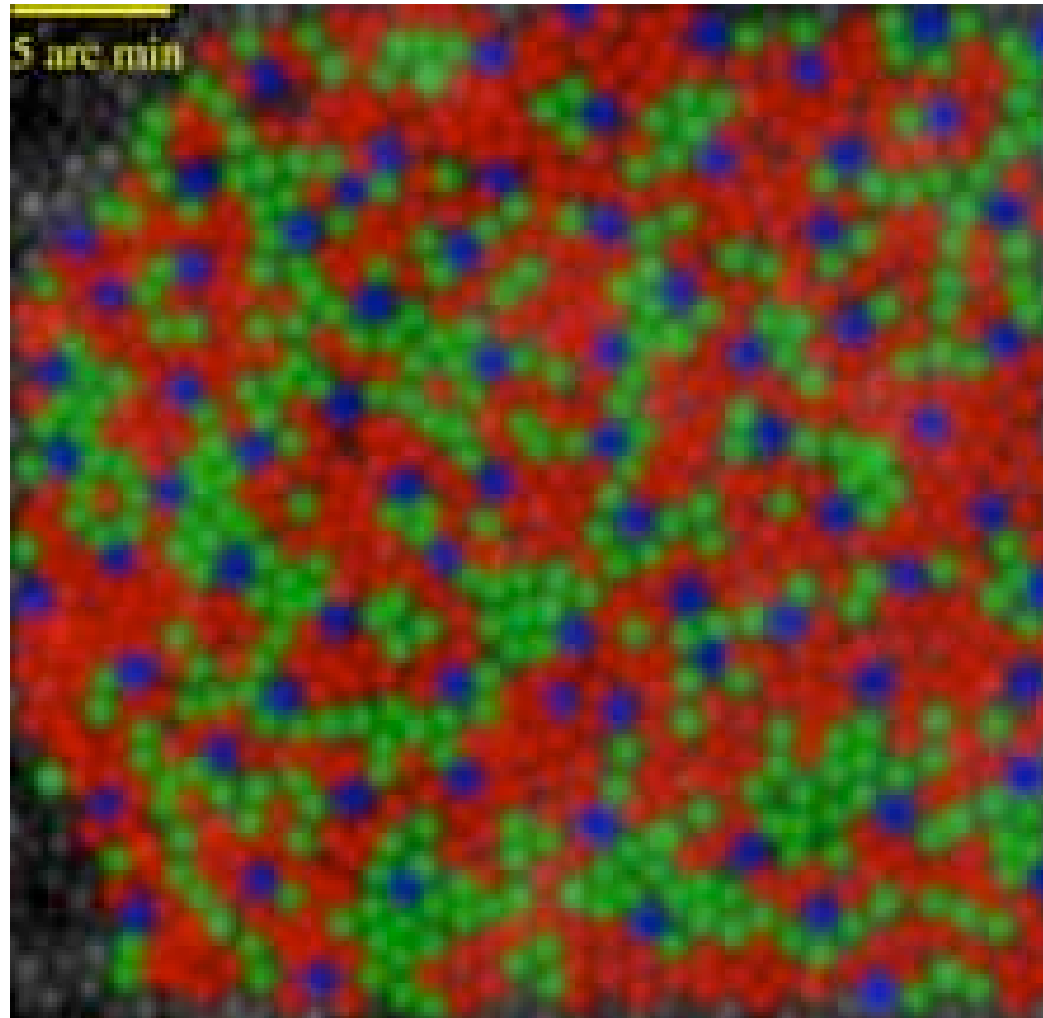


# Human cone sensitivities



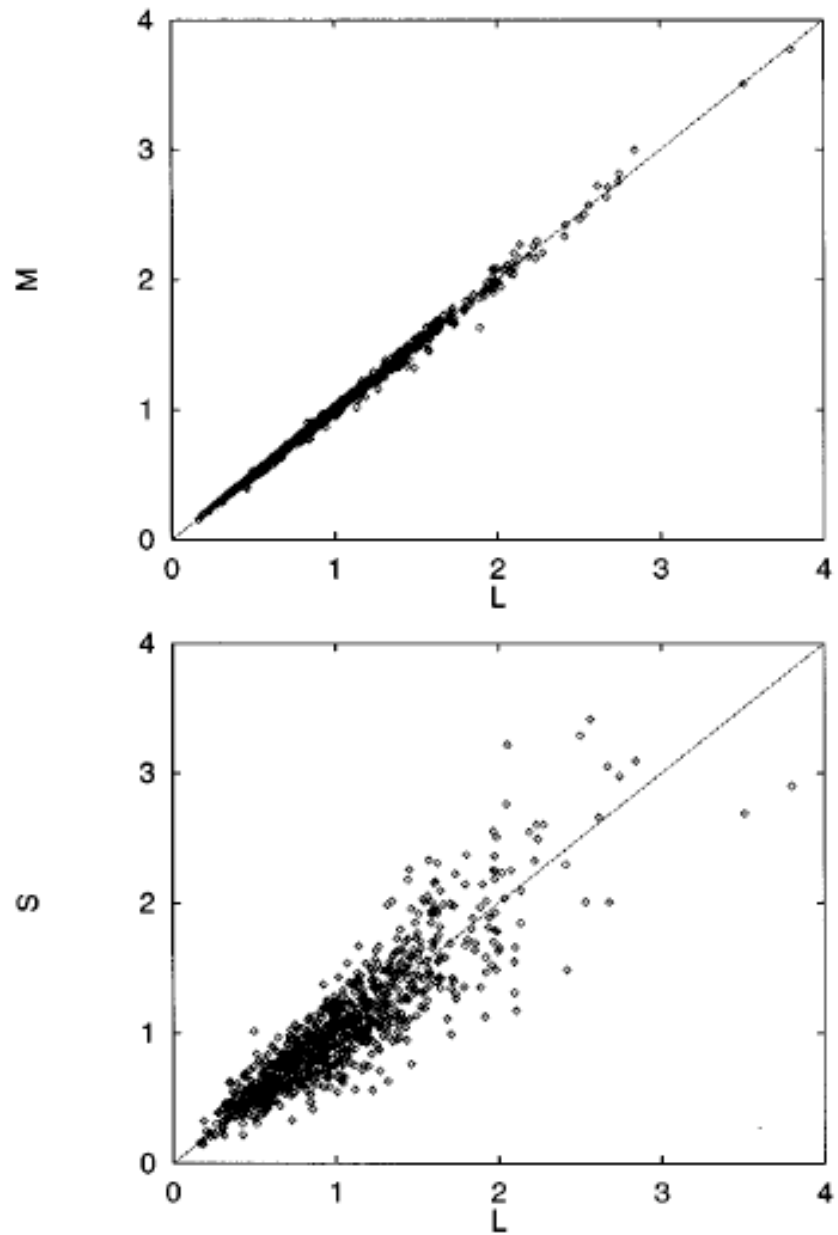
# Human cone mosaic

(Roorda & Williams)



# Joint statistics of cone responses

(Ruderman et al. 1998)



# PCA of cone responses

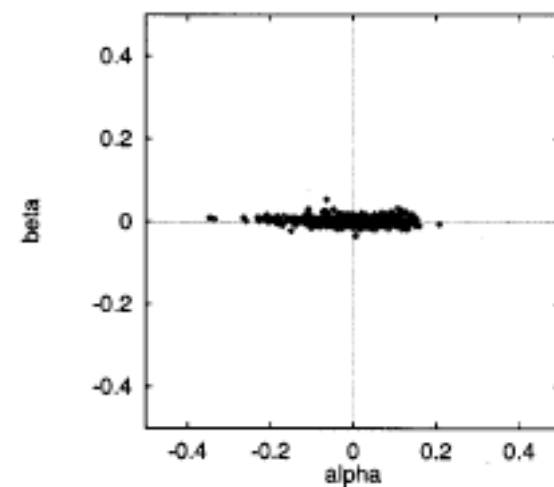
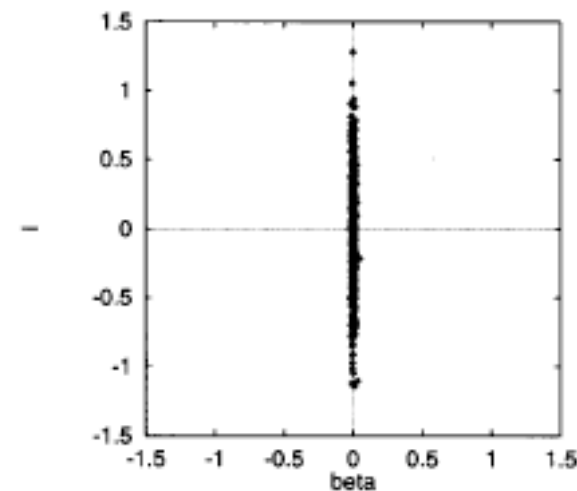
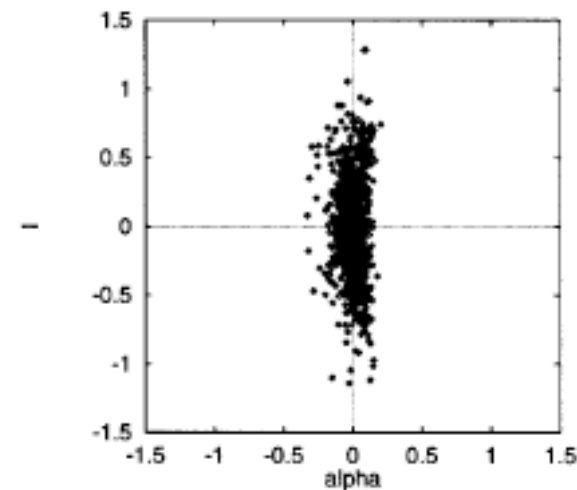
(Ruderman et al. 1998)

$$\hat{l} = \frac{1}{\sqrt{3}} (\hat{\mathcal{L}} + \hat{\mathcal{M}} + \hat{\mathcal{S}}),$$

$$\hat{\alpha} = \frac{1}{\sqrt{6}} (\hat{\mathcal{L}} + \hat{\mathcal{M}} - 2\hat{\mathcal{S}}),$$

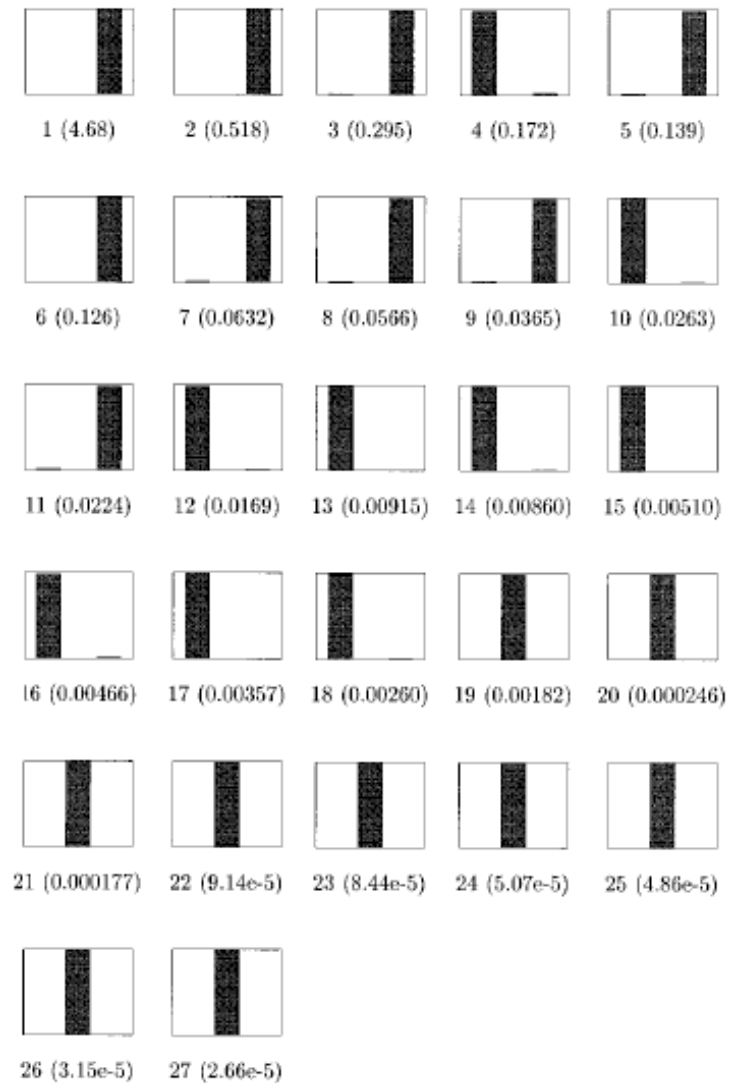
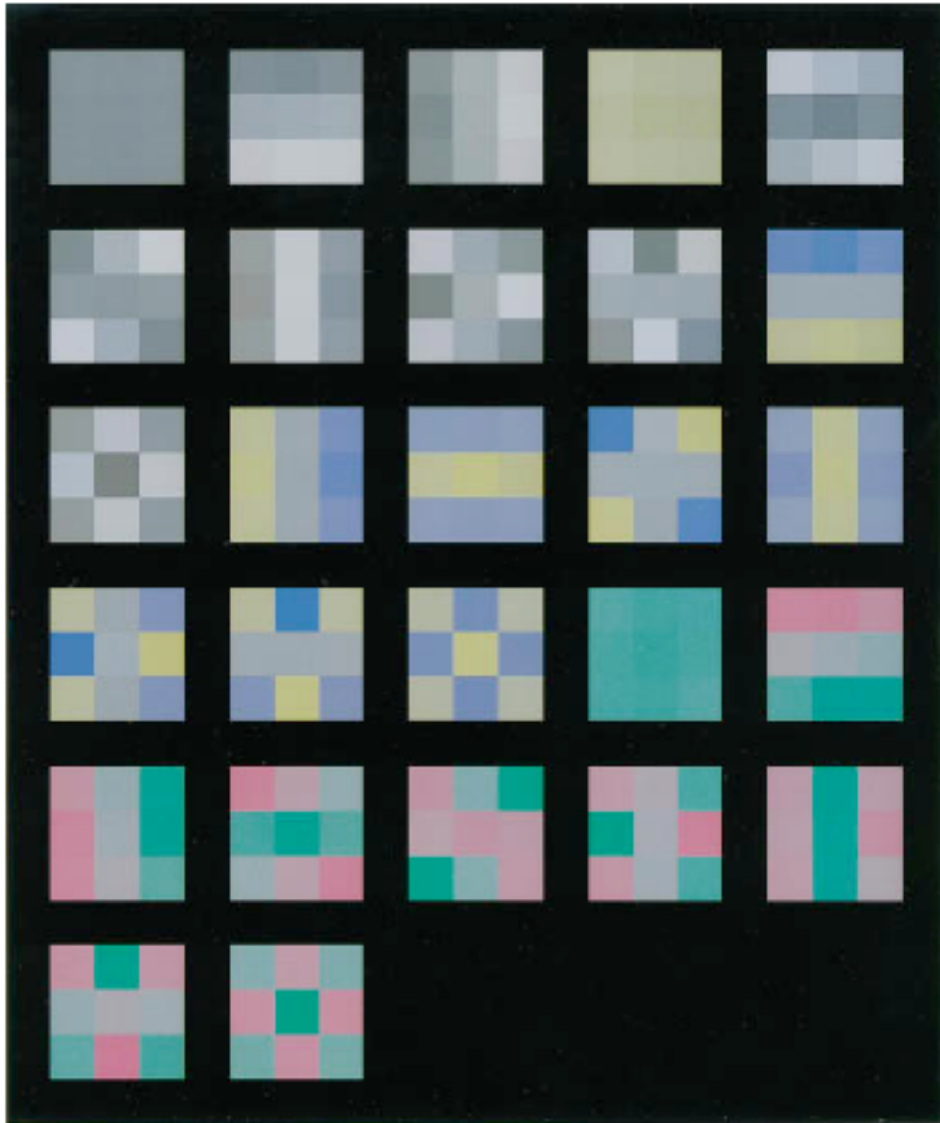
$$\hat{\beta} = \frac{1}{\sqrt{2}} (\hat{\mathcal{L}} - \hat{\mathcal{M}}),$$

where  $\mathcal{L} = \log L - \langle \log L \rangle$ ,  
 $\mathcal{M} = \log M - \langle \log M \rangle$ ,  
 $\mathcal{S} = \log S - \langle \log S \rangle$ .



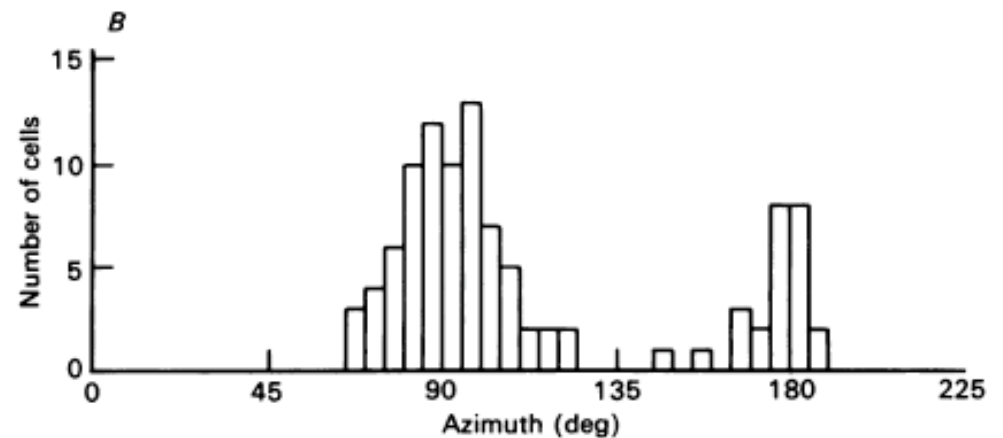
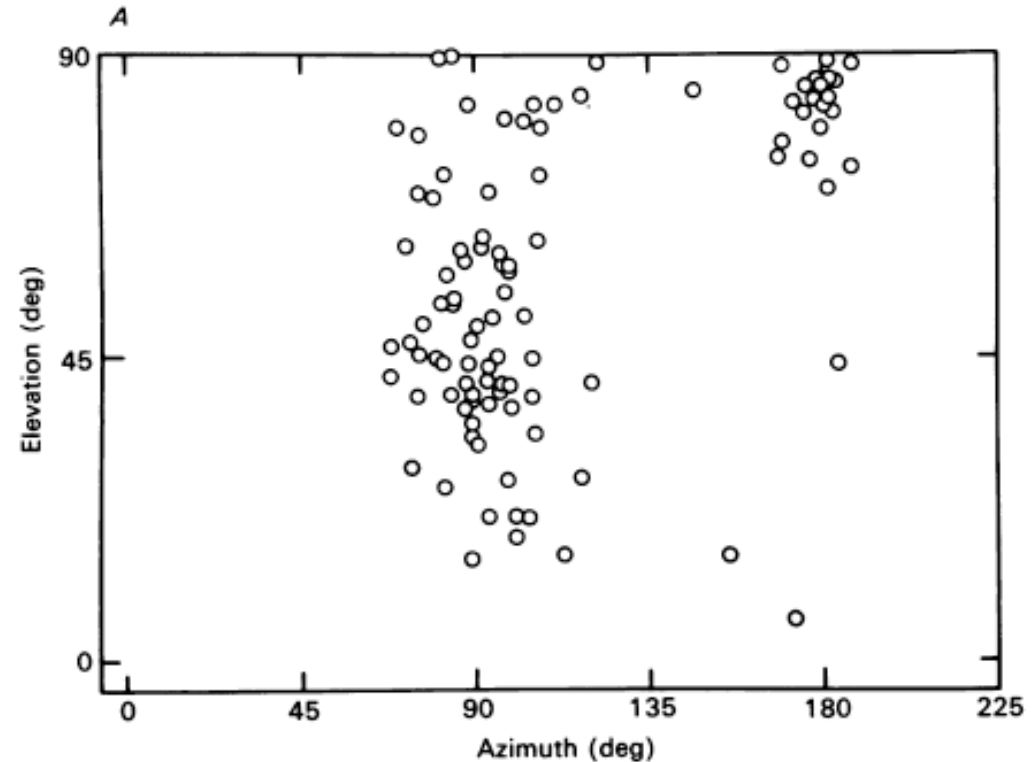
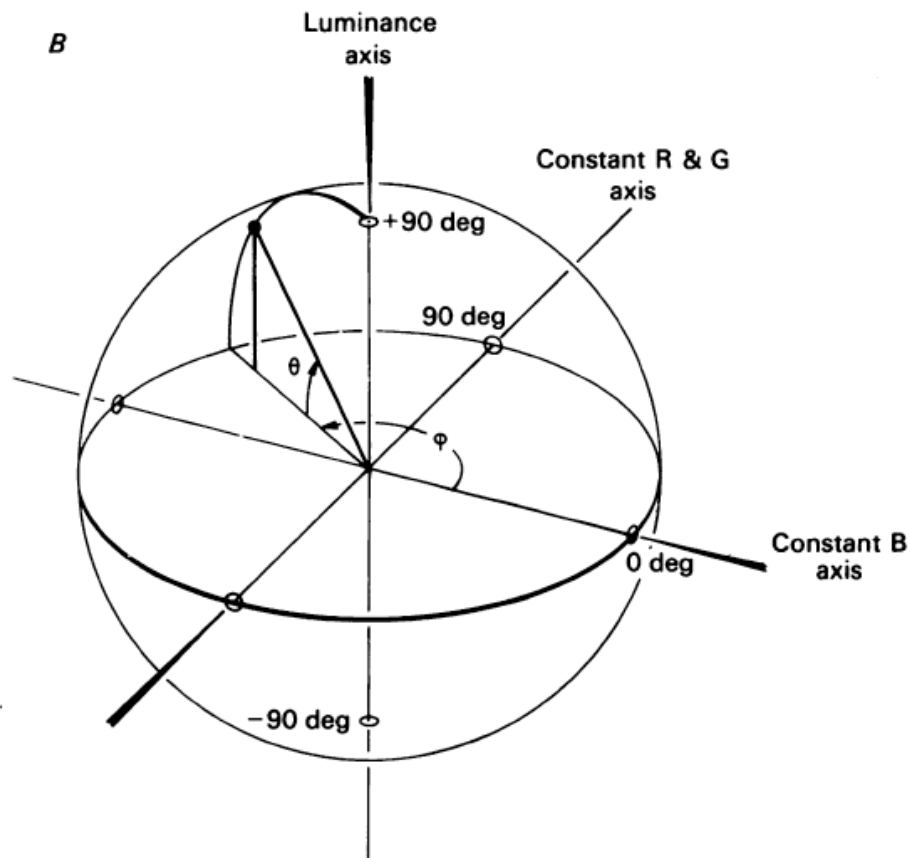


# Spatio-chromatic PCA

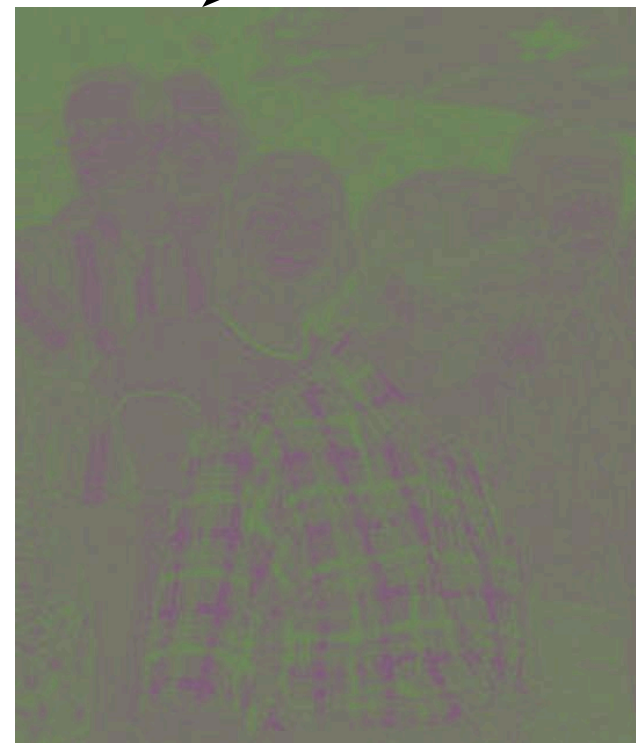


# Color opponency in LGN

(Derrington, Krauskopf & Lennie, 1984)

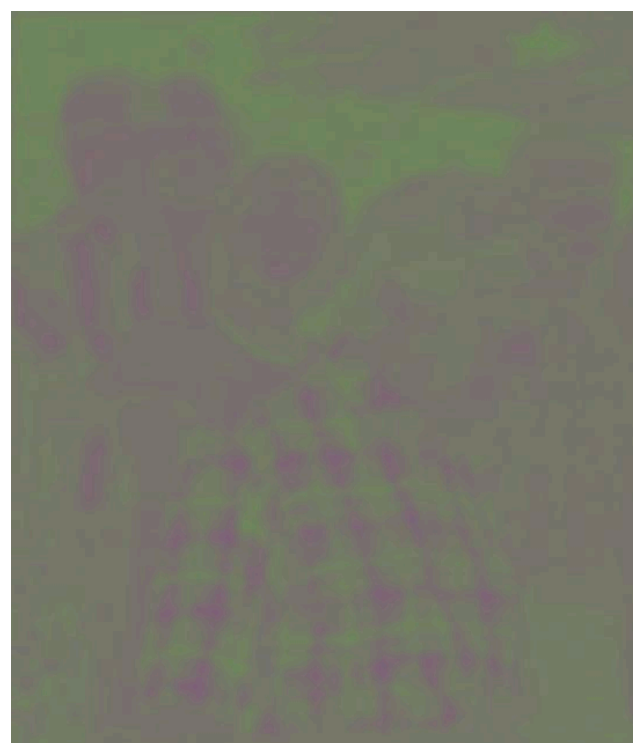
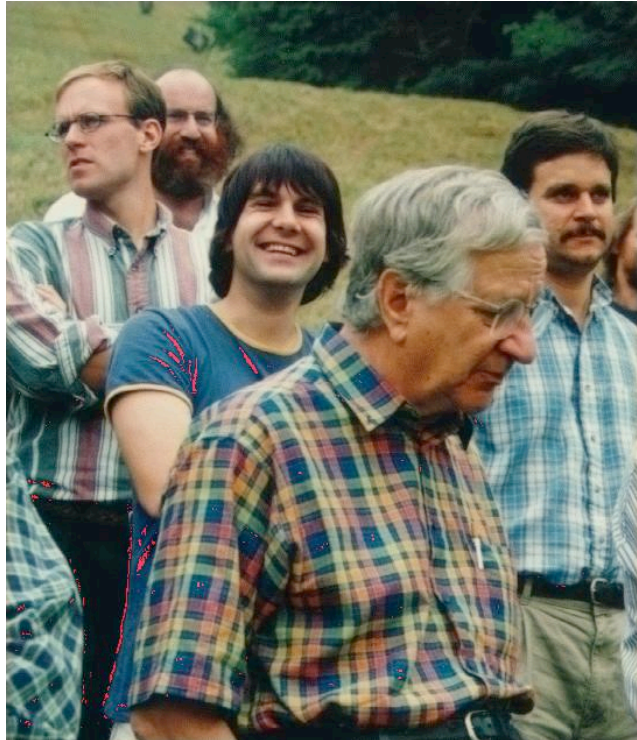


# Decomposition into luminance and color-opponent channels



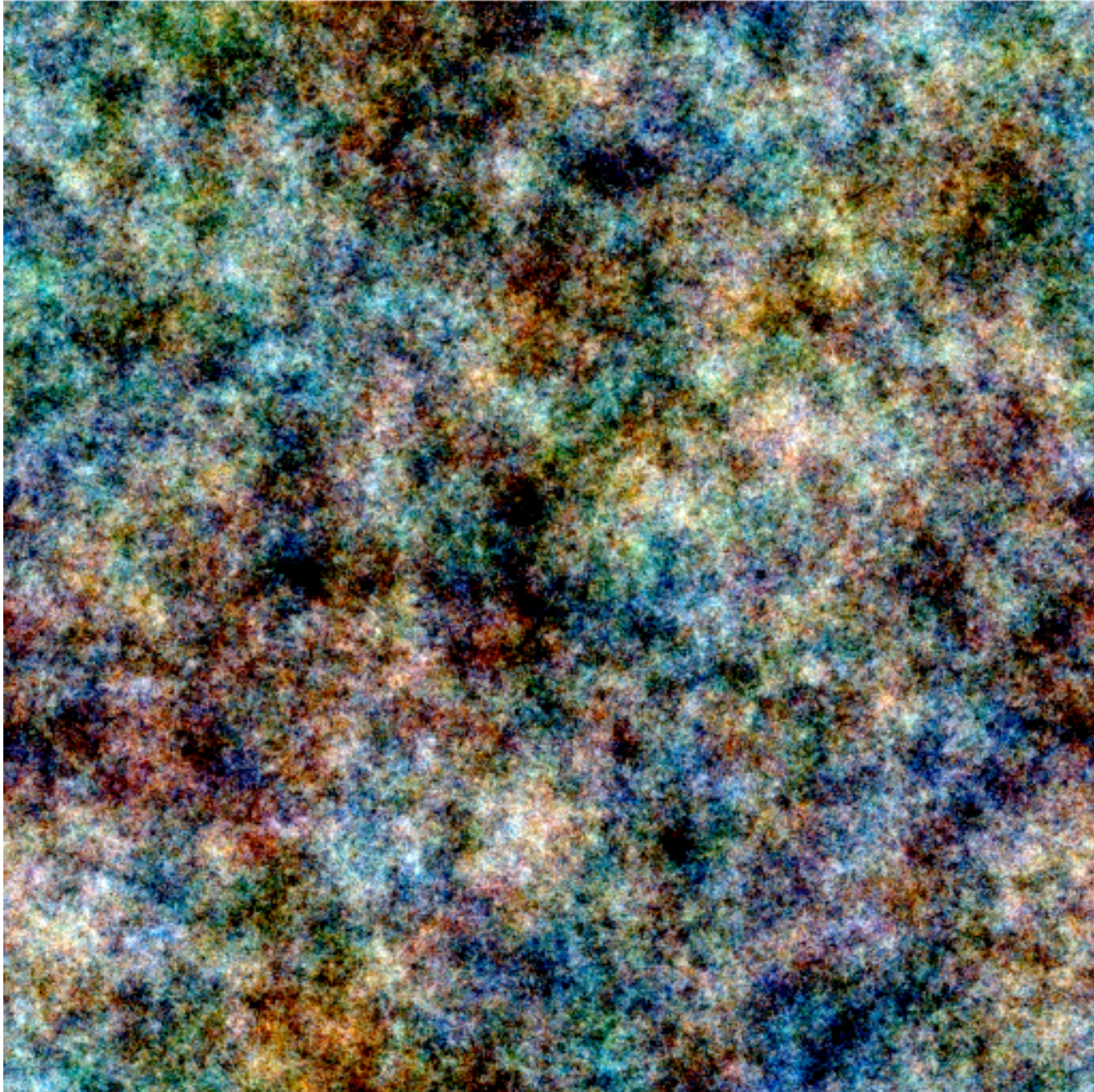


# Reconstruction from blurred color-opponent channels

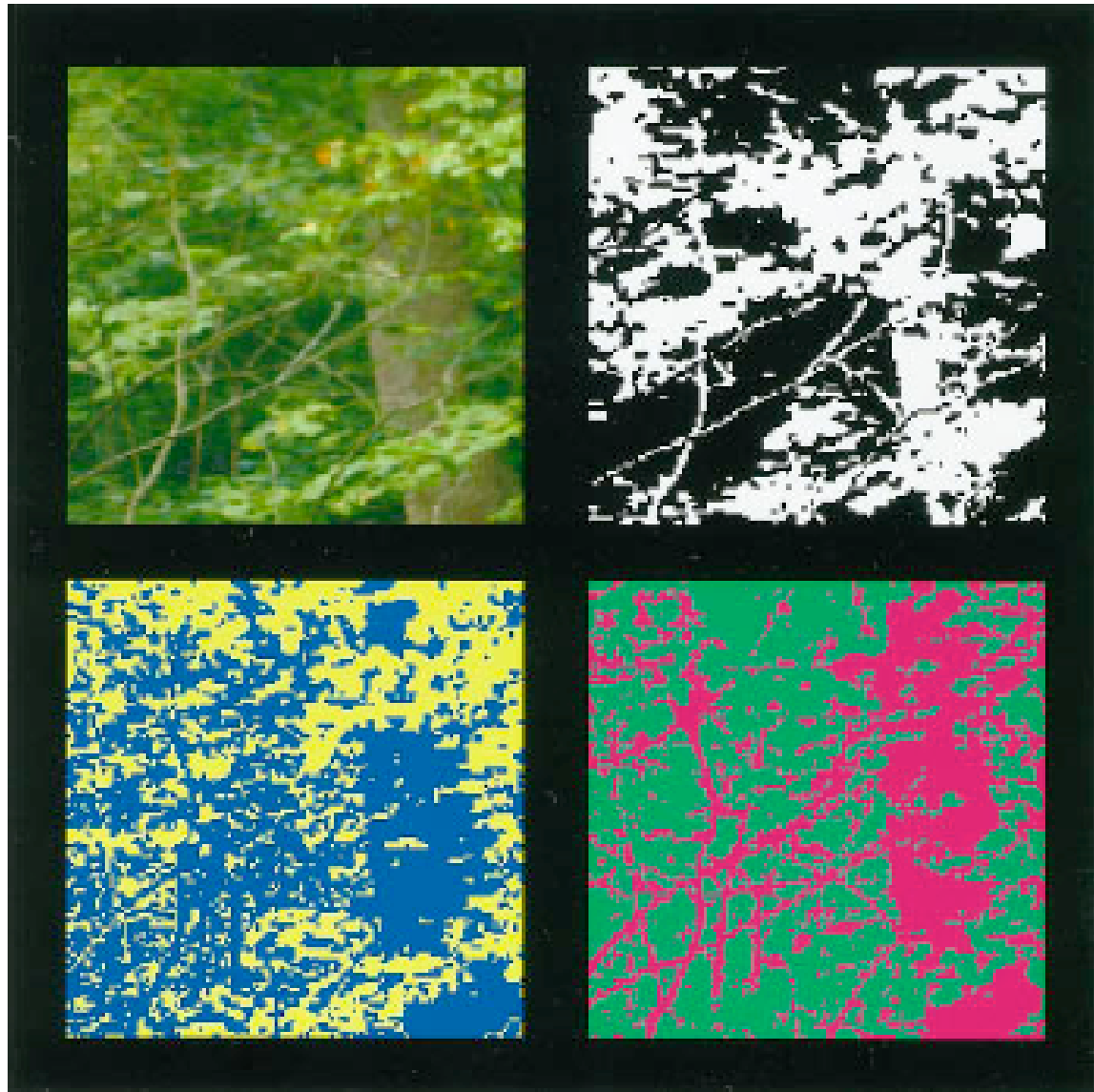




# Image synthesis

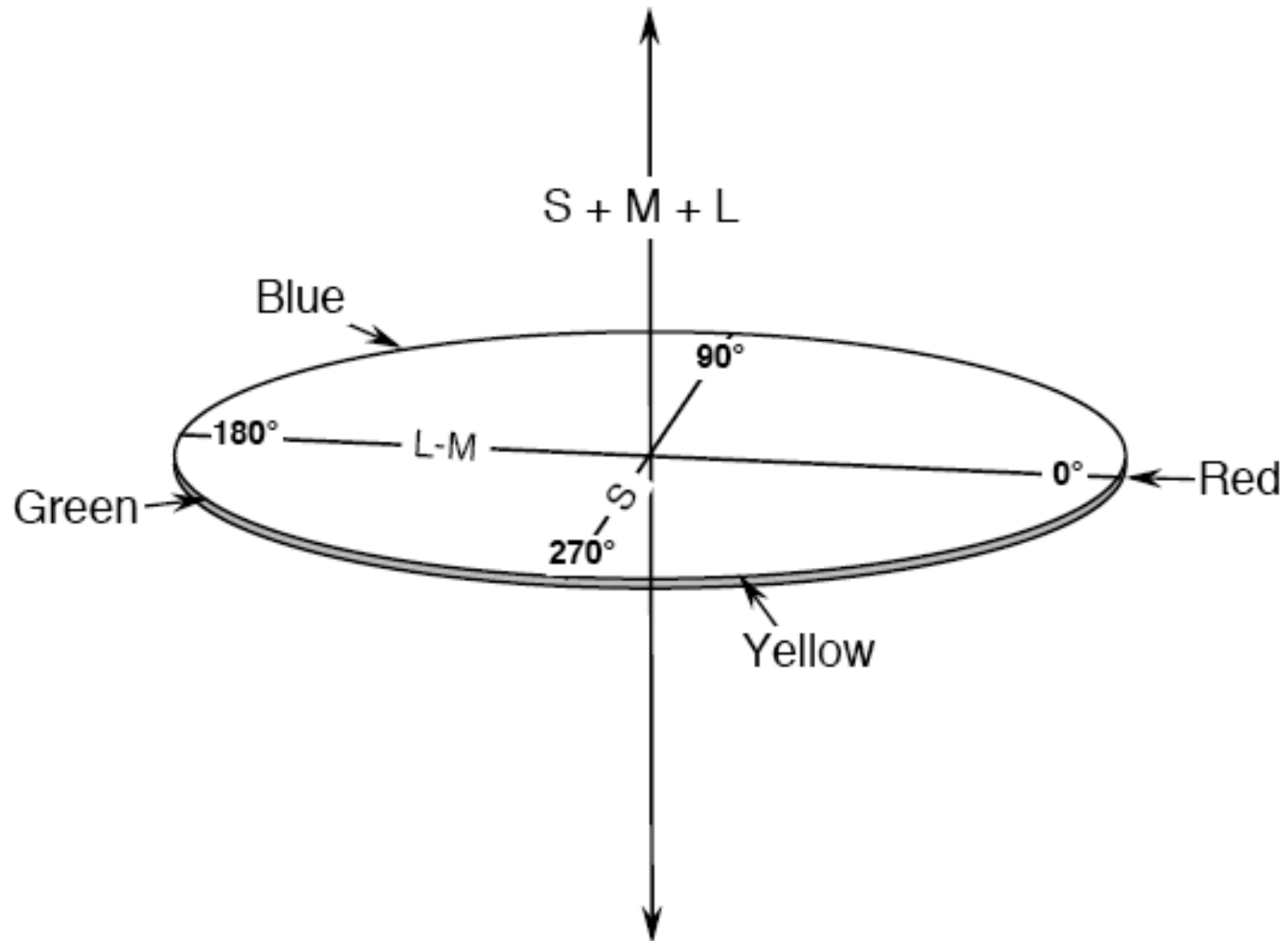


# Color edges co-occur with luminance edges



Ruderman et al. (1998)

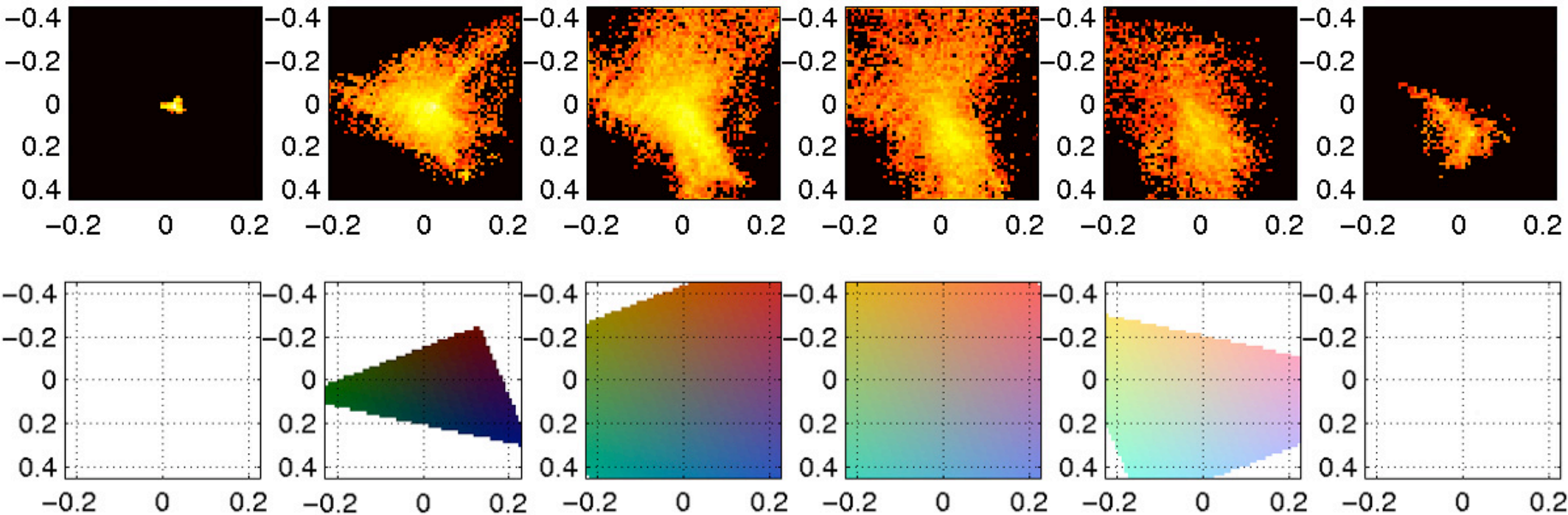
# ‘Unitary hues’





# Distribution of r,g,b values in Corel natural images suggests basic color categories may exist in data

distribution



colorspace