

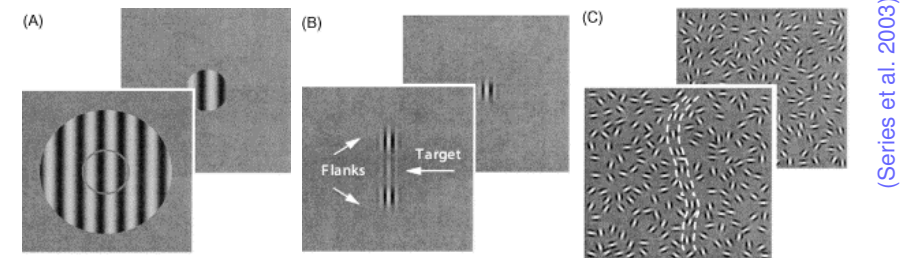
# Modeling Adult Visual Function

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## Surround modulation



Apparent contrast  
reduces

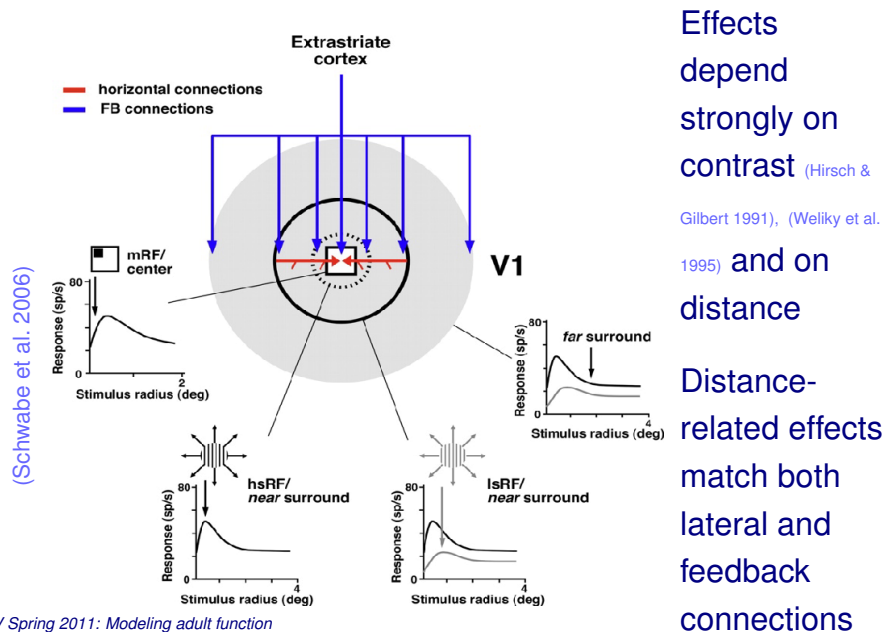
Detection facilitated

Contour pops out

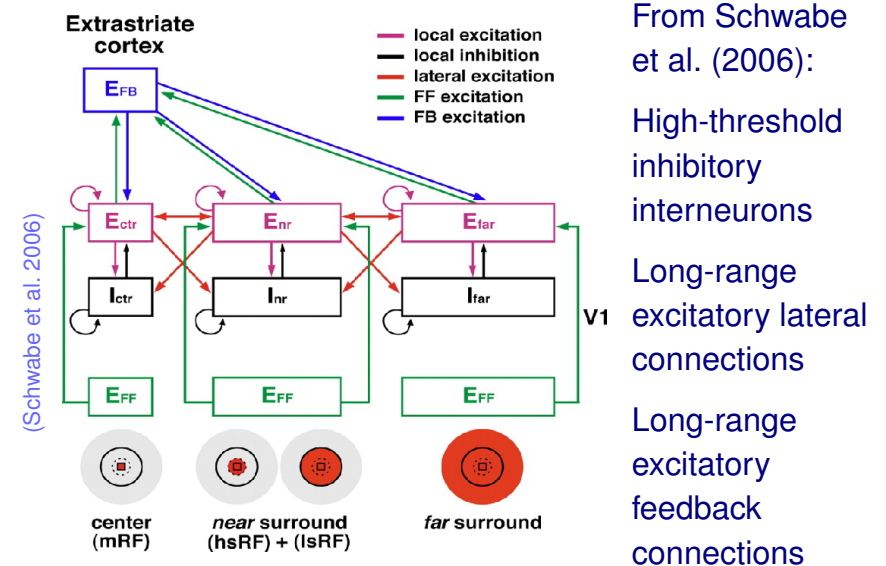
Many types of contextual interactions are known

(Series et al. 2003)

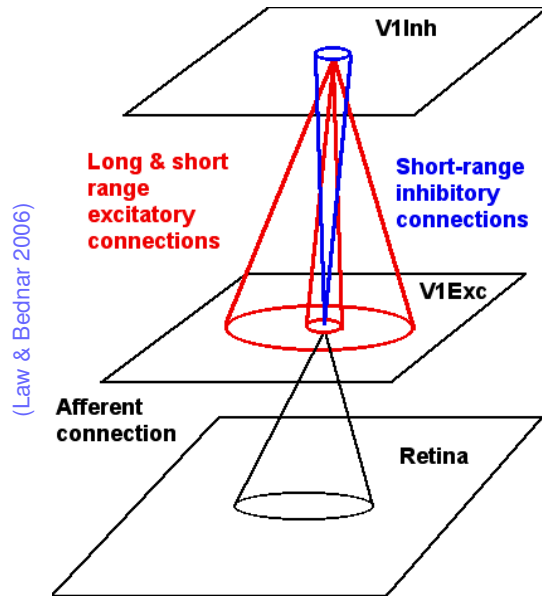
## Surround modulation



## Proposed model circuit



## LESI circuit



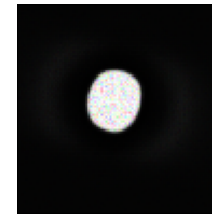
From Law & Bednar (2006):

High-threshold inhibitory interneurons

Long-range excitatory lateral connections

No feedback connections yet

## Effective lateral inhibition



Excitatory activity



Inhibitory activity

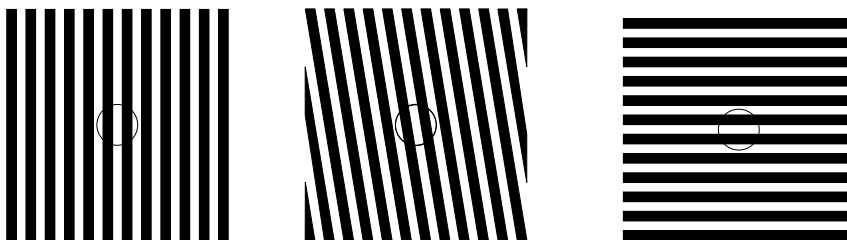
(Law 2009)

At high contrasts, the activity in the inhibitory sheet has wider radius than the activity in the excitatory sheet.

Result: Acts like Mexican-hat lateral interaction function, but using long-range excitatory connections.

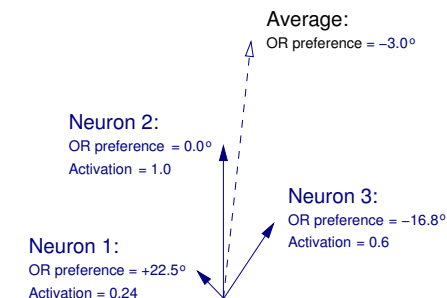
Self-organization thus works as usual (since Hebbian learning is dominated by the high-contrast inputs), but circuitry is correct and low-contrast behavior can be correct.

## The Tilt Aftereffect (TAE)



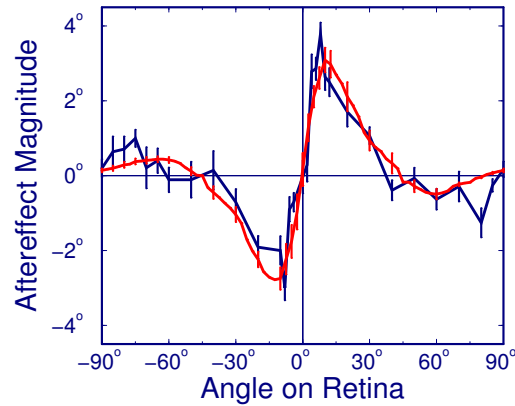
- Bias in orientation perception after prolonged exposure
- Allows model structure to be related to adult function
- Classic explanation: “fatigue” – activated neurons get tired, shifting the population average away

## Measuring perceived orientation



- Assumption: perception based on population average
- Vector average good for cyclic quantities
- Decode perception before and after adaptation

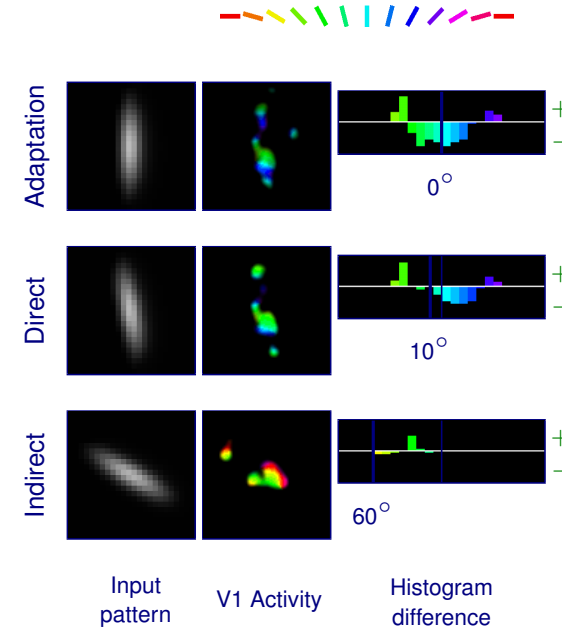
## TAE in Humans and LISSOM



■ Mitchell & Muir 1976  
■ HLISSOM

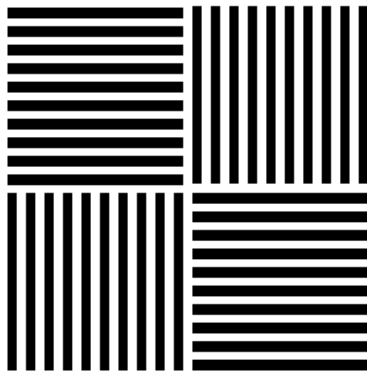
- Direct effect for small angles
- Indirect effect for larger angles
- Null effect at training angle
- Human, model match closely

## TAE Adaptation in LISSOM



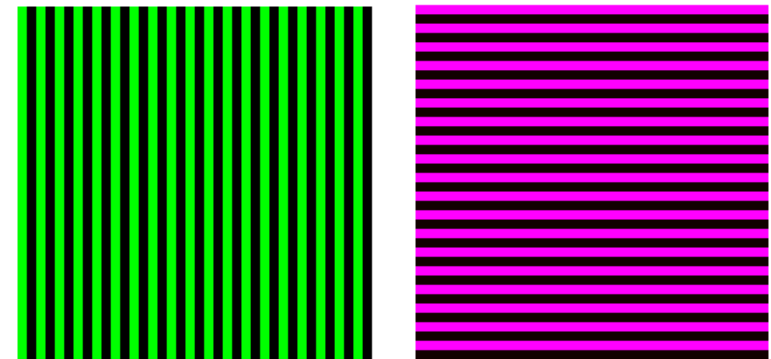
- **Null at zero:** More inhibition, but no net change in perception
- **Direct effect:** More inhibition for angles  $< 10^\circ$ 
  - Perception shifts from 10 to  $14^\circ$
- **Indirect effect:** Less inhibition for angles  $< 60^\circ$ 
  - Perception shifts from 60 to  $58^\circ$
- Due to synapses, not tired neurons!

## McCollough effect test pattern



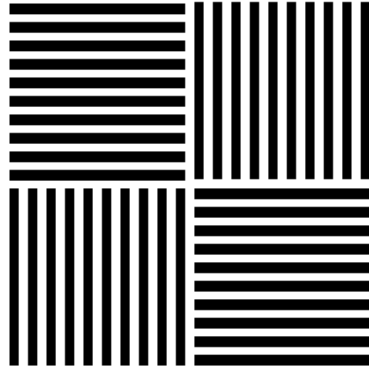
Before adaptation, this pattern should appear monochrome

## Adaptation pattern



Stare alternately at the two patterns for 3 minutes, moving your gaze to avoid developing strong afterimages

# McCollough effect

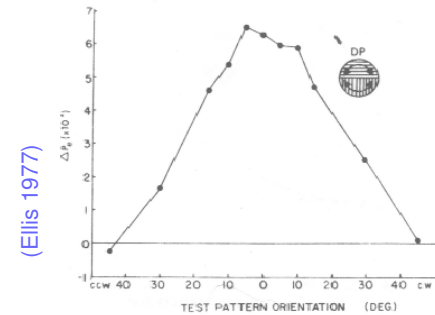


(McCollough 1965)

After adaptation:

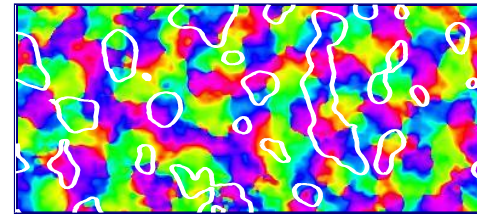
- Vertical bars should be slightly magenta
- Horizontal bars should be slightly green
- The effect should reverse if you tilt your head 90°, and disappear if you tilt 45°.

# McCollough effect: data



(Ellis 1977)

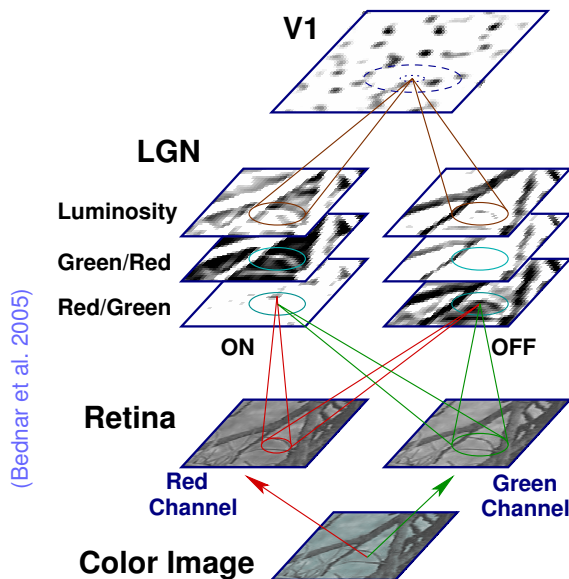
(Landisman & Ts'o 2002)



2.3 × 5.3mm macaque V1

- Effect measured in humans at each angle between adaptation and test
- Strength falls off smoothly with angle
- V1 is earliest possible substrate – first area showing OR selectivity; has color map

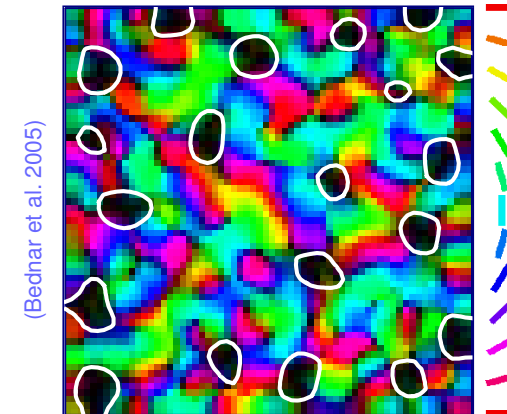
# LISSOM Color V1 Model



- Input: RGB images
- Decomposed into Red, Green channels (no blue in central fovea, Calkins 2001)
- Processed by color opponent retinal ganglia

(Bednar et al. 2005)

# LISSOM OR + Color map



(Bednar et al. 2005)

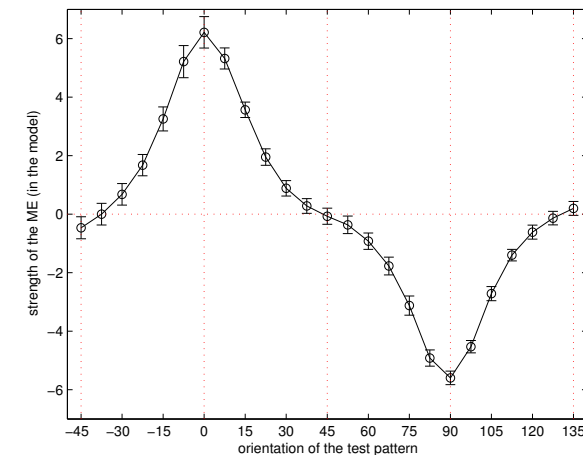
- Orientation map similar to animal maps
- Color-selective cells occur in blobs
- Each blob prefers either red or green

# Calculating McCollough Effect

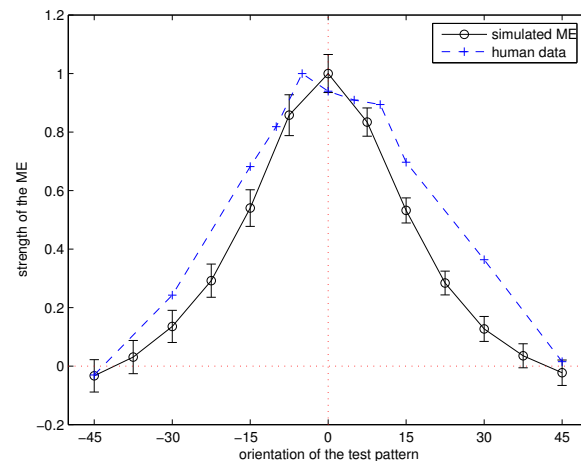
- Perceived color estimated as a vector average of all units
- Vector direction: + for red-selective units, - for green-selective units
- Weighted by activation level and amount of color selectivity

Result is a number from extreme red (positive) to extreme green (negative), with approximately 0 being monochrome.

# Model McCollough Effect



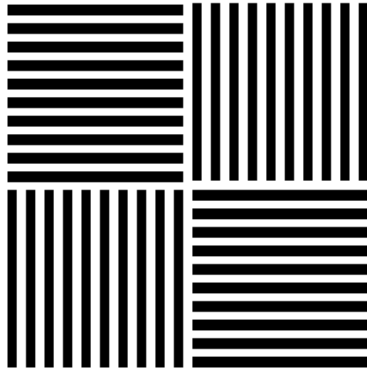
# Compared with human



# Summary

- LISSOM can be compatible with actual circuit
- May explain surround modulation
- Aftereffects arise from Hebbian adaptation of lateral inhibitory connections
- The same self-organizing processes can drive both development and adaptation: both structure and function
- **Novel prediction:** Indirect effect due to weight normalization

# McCollough Effect



Is the effect still  
present?

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