



# Attention to Objects and Perceptual Organization

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Jeremy Wolfe, Harvard U.

# OBJECTIVE

**Information overload impacts technological and biological systems. Example: Surveillance (but really anything)**

**Solution: Selective attention, i.e. sequential selection and processing of the most relevant information only**

**Our approach: Use mechanisms of perceptual organization to structure sensory input and guide attention according to primate neural representations**

**Different from other attentional approaches: organize sensory scene not by spatial relationships (pixels) but by perceptual (proto-)objects**

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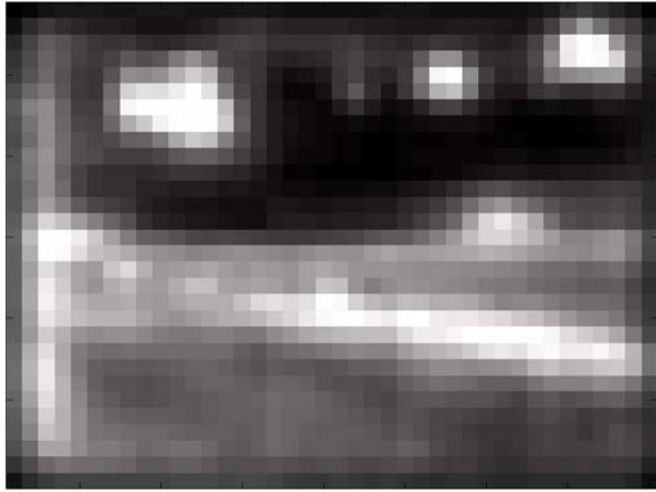
**Sparsity (in space and time!)**

**Our approach: Use mechanisms of perceptual organization to structure sensory input and guide attention according to primate neural representations**

**Different from other attentional approaches: organize sensory scene not by spatial relationships (pixels) but by perceptual (proto-)objects**

# Classical approach: Saliency map

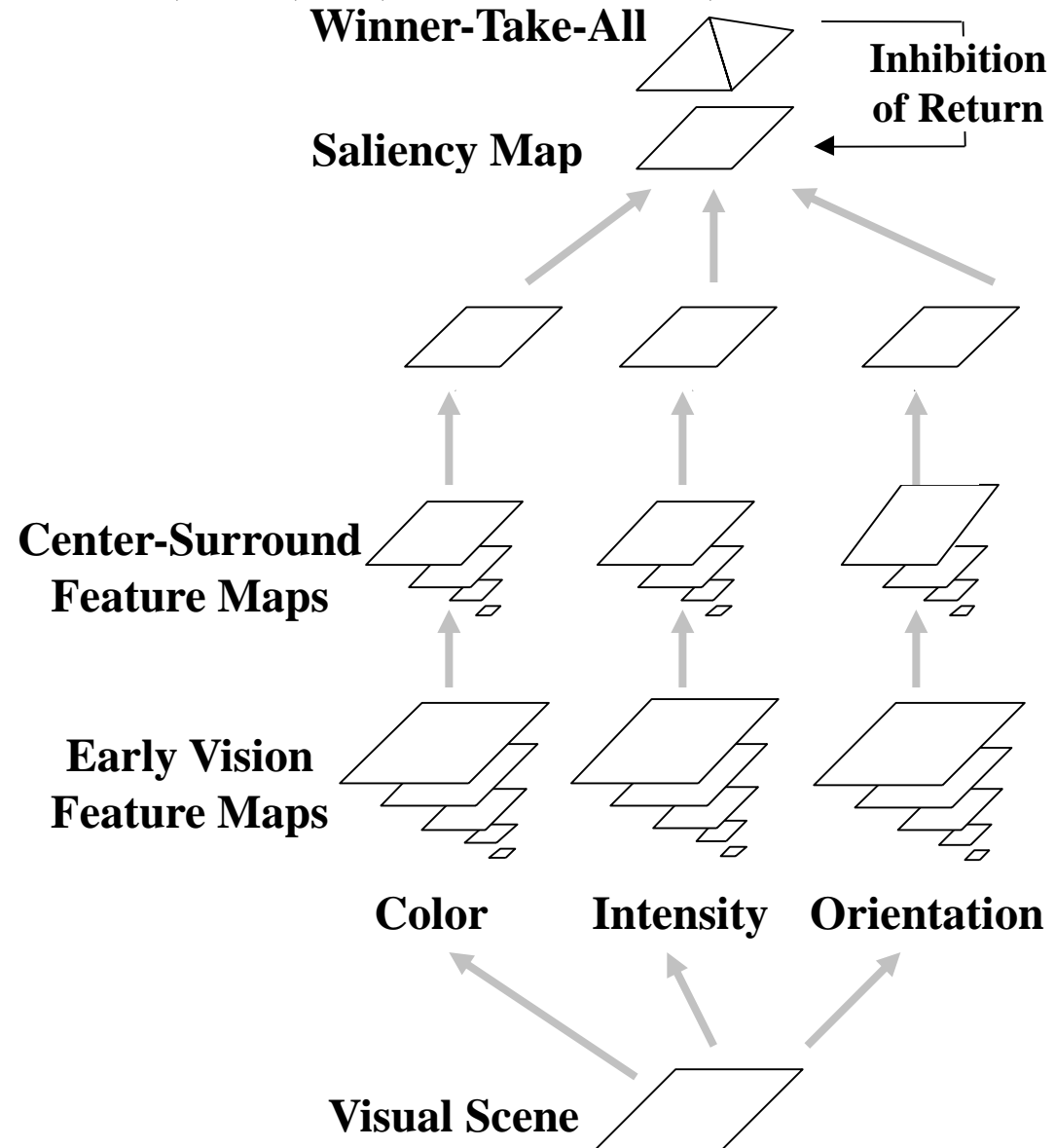
(Koch & Ullman, 1985; Niebur & Koch, 1996; Itti, Koch & Niebur, 1998)



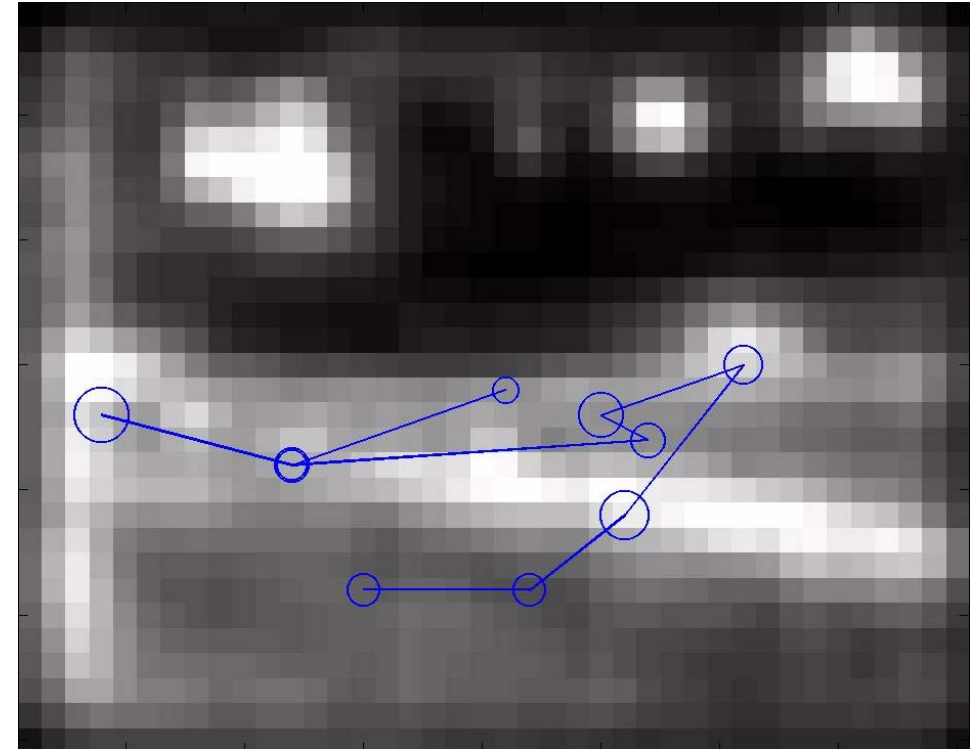
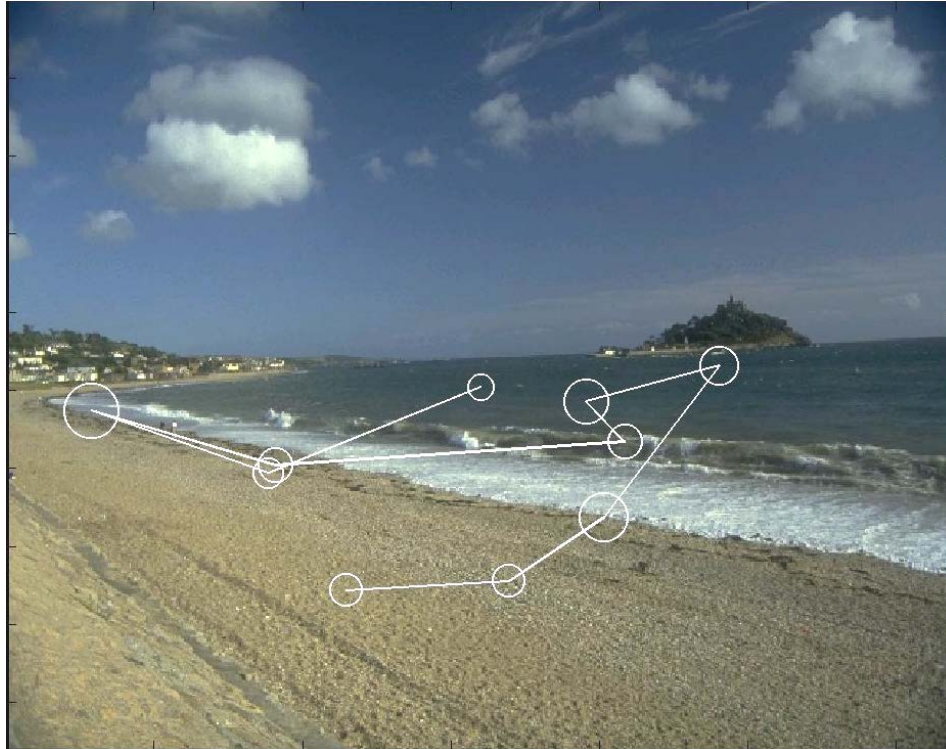
**Saliency Map**



**Visual Scene**



# Saliency map is predictive of eye movements



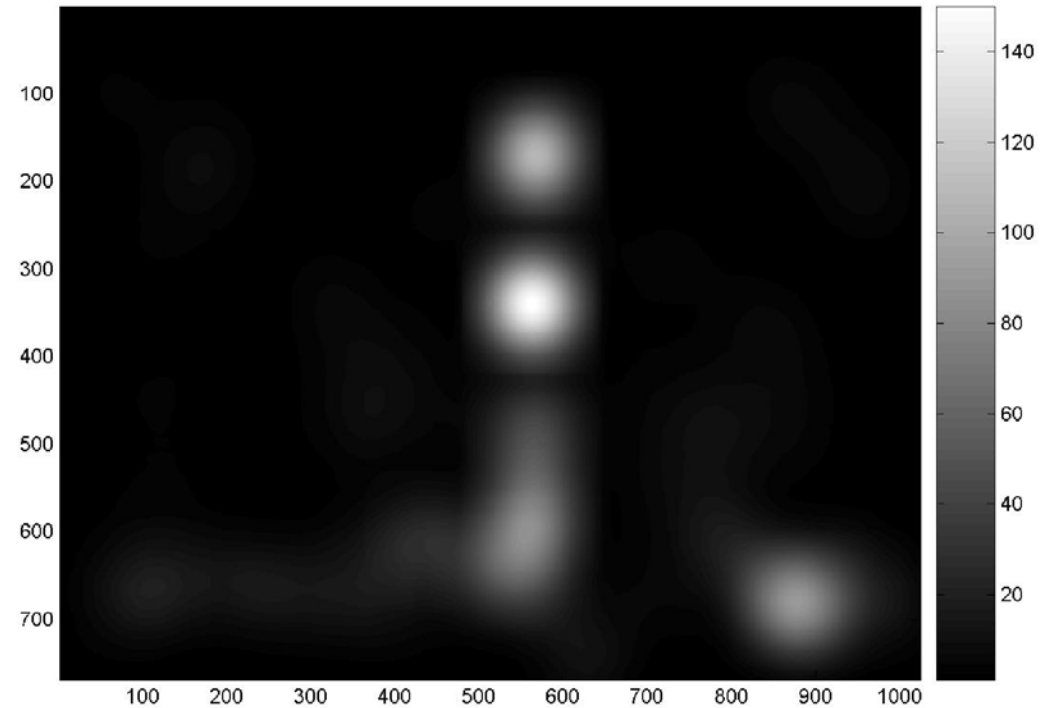
**Parkhurst et al, Vision Research 2002**

# Interest Maps

**Conscious selection of “5 most interesting points”**

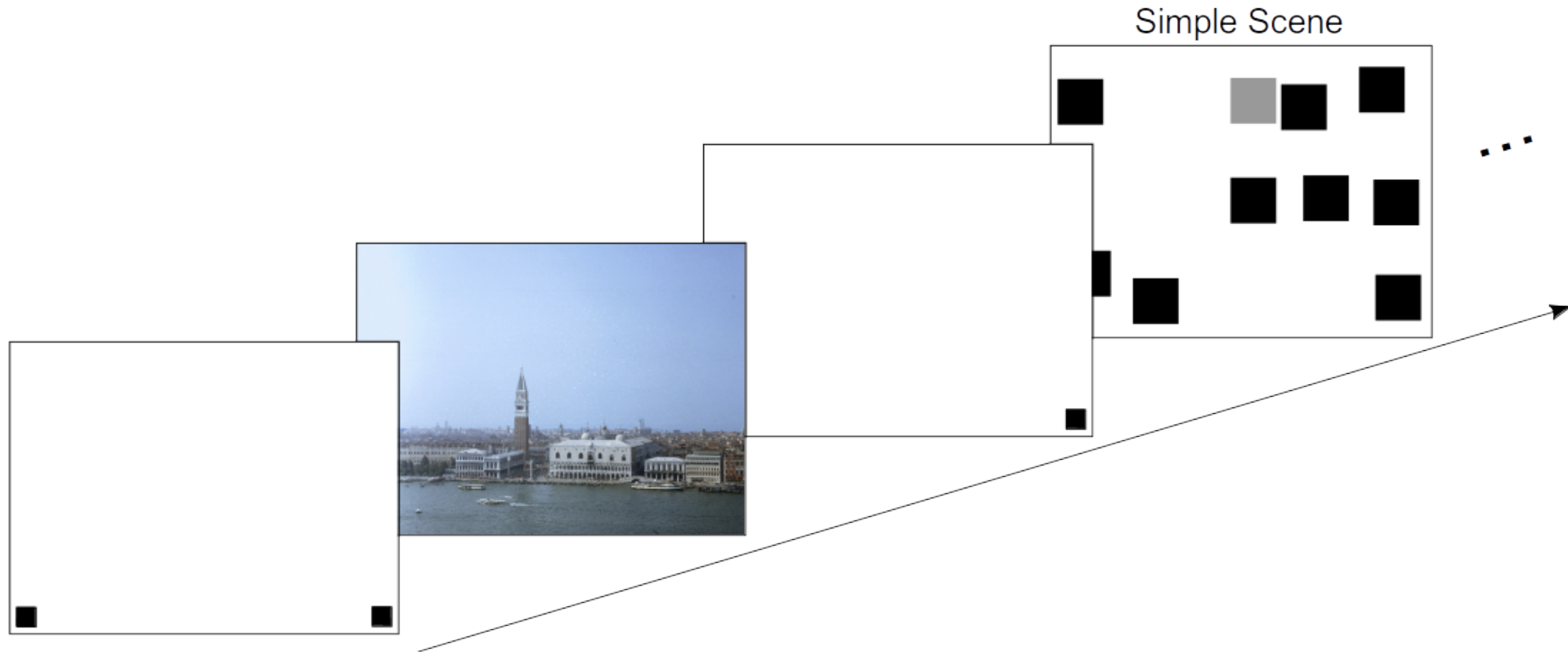
**15 images from database of 100 natural scenes**

**874 participants**



**Interest is highly correlated with fixations and with saliency map**

# Tap Maps



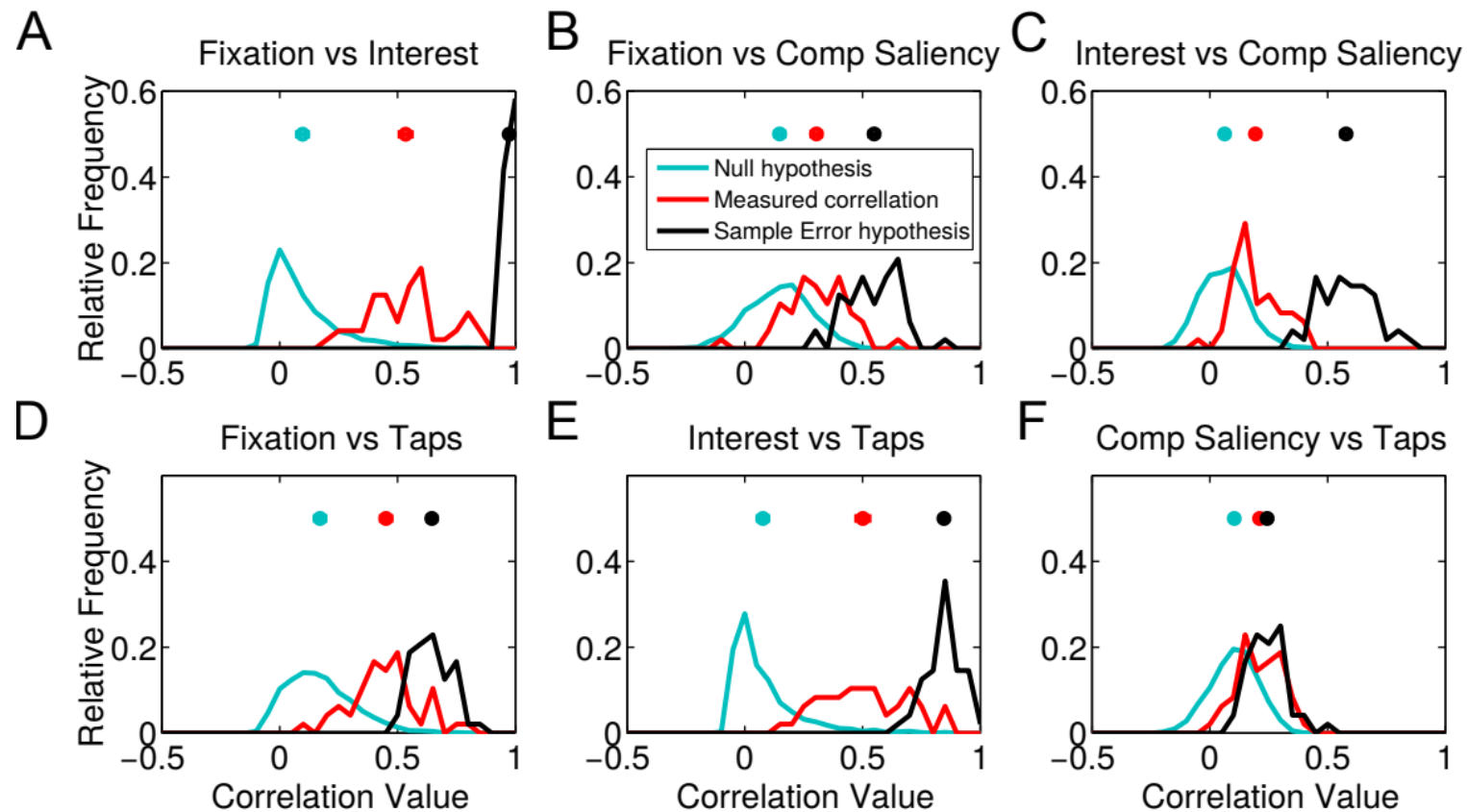
**“Tap at the first location you look at!”**

**Minimize top-down influences**

Jeck et al, Vision Research 2017



# Tap Maps



**Result: Taps are highly significantly correlated with**

- **Fixations**
- **Interest**
- **Computational Saliency**

# Saliency map: Limitations

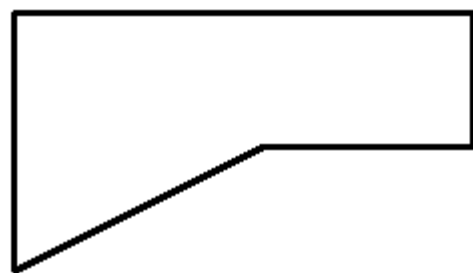
**Very successful but**

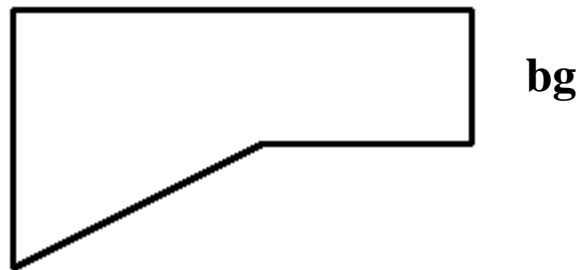
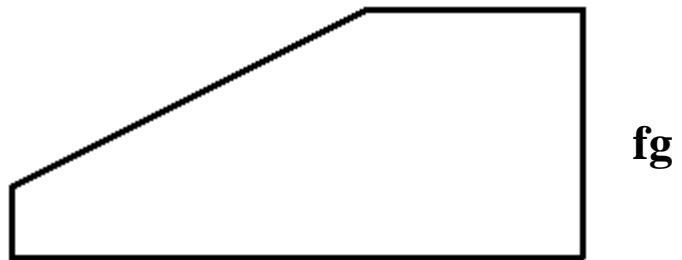
- **Fundamental elements are 'pixels' (~RGC activity) while biological attention operates on perceptual objects**

**How do we add the notion of *objects*?**

**Not trivial!**



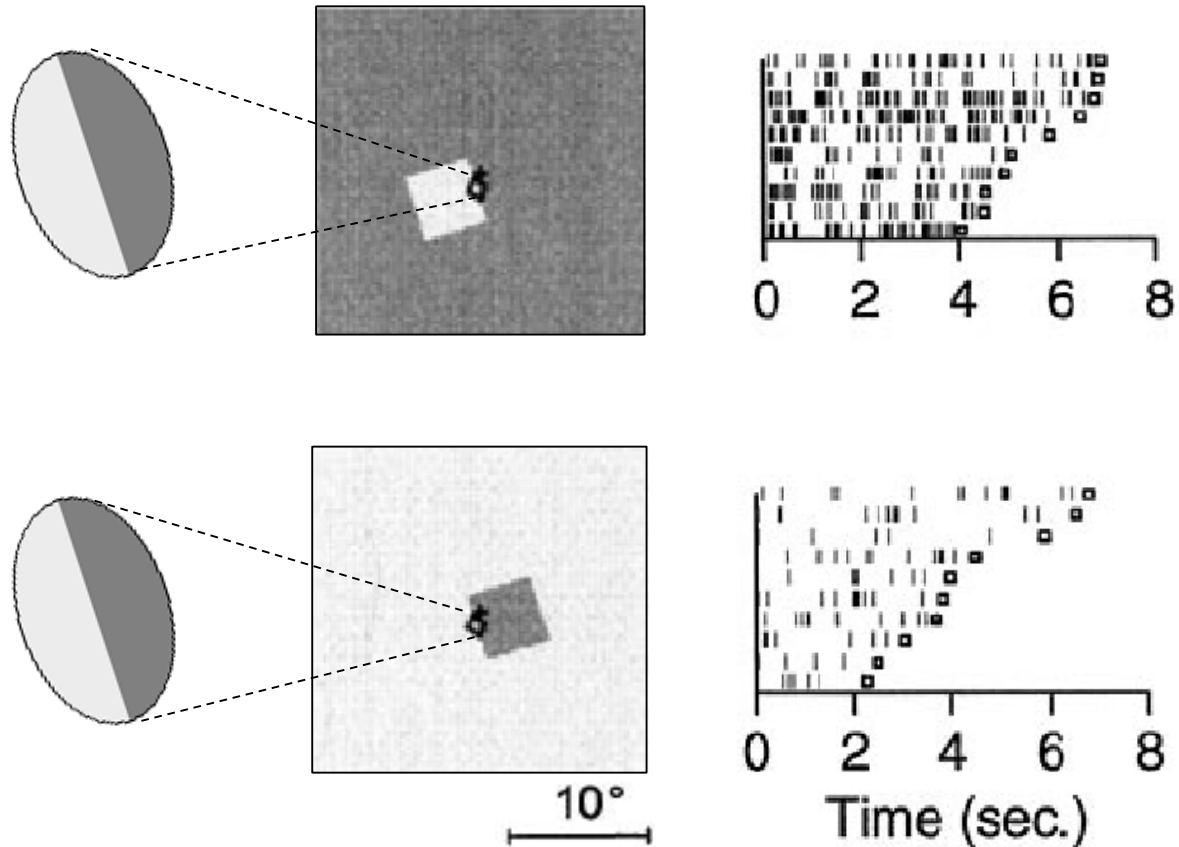




Neuronal representation of image  
context in visual cortex

# Border Ownership Coding In Primate Extrastriate Cortex

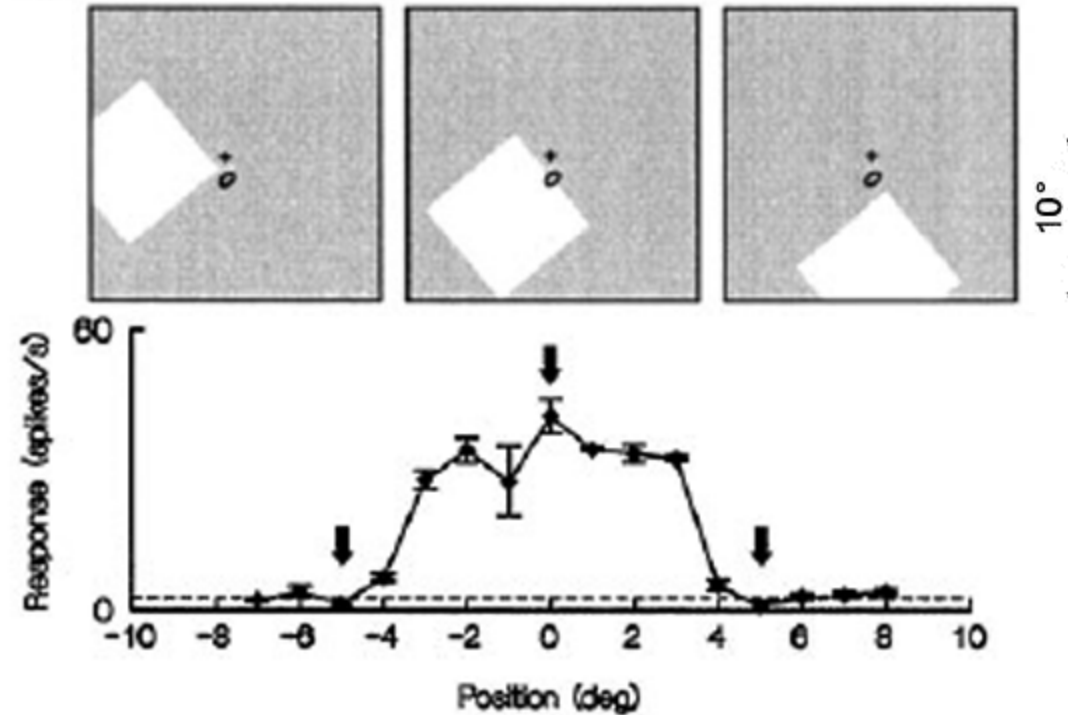
Cell 13id4 (V2)



Zhou, H., H. S. Friedman, and R. von der Heydt. "Coding of border ownership in monkey visual cortex." *J. Neurosci.* 20.17 (2000): 6594-611.

# Receptive Fields in V2 are Small

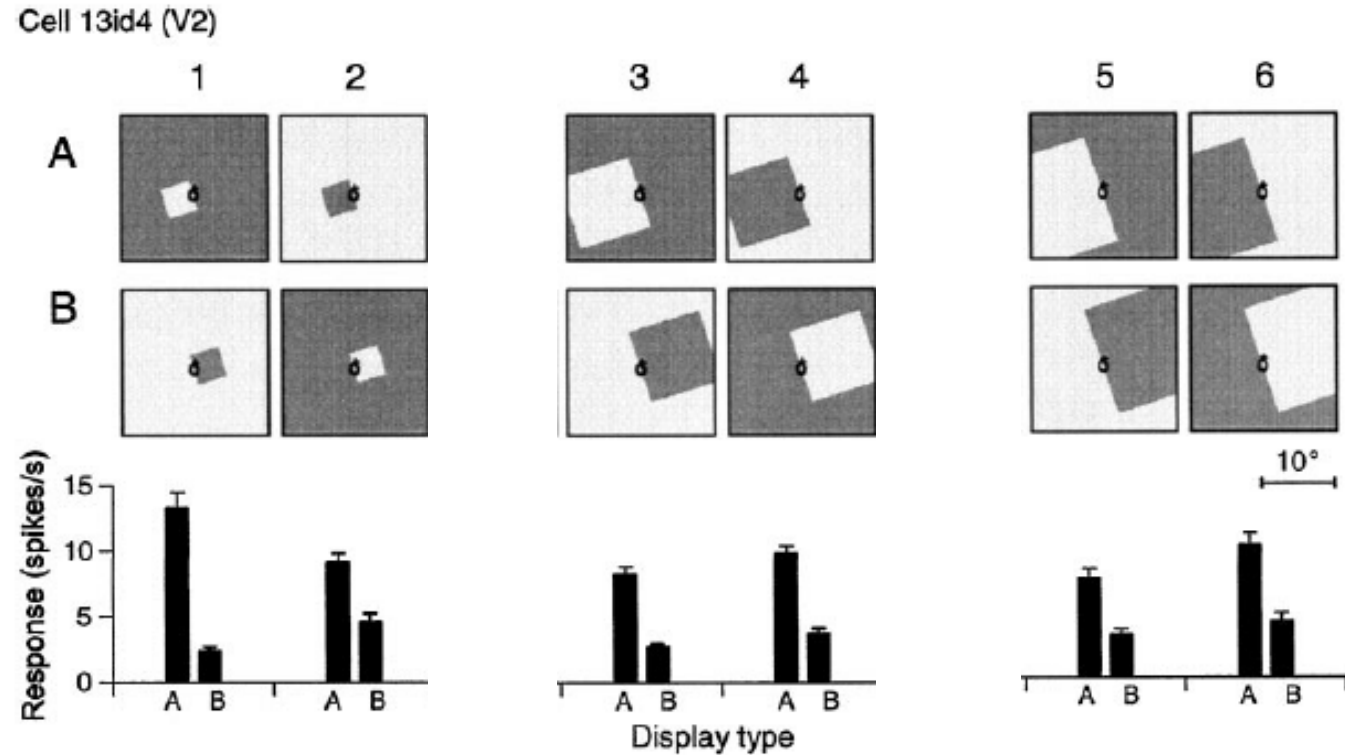
Cell 13jj7 (V2)



Zhou, H., H. S. Friedman, and R. von der Heydt. "Coding of border ownership in monkey visual cortex." *J.Neurosci.* 20.17 (2000): 6594-611.

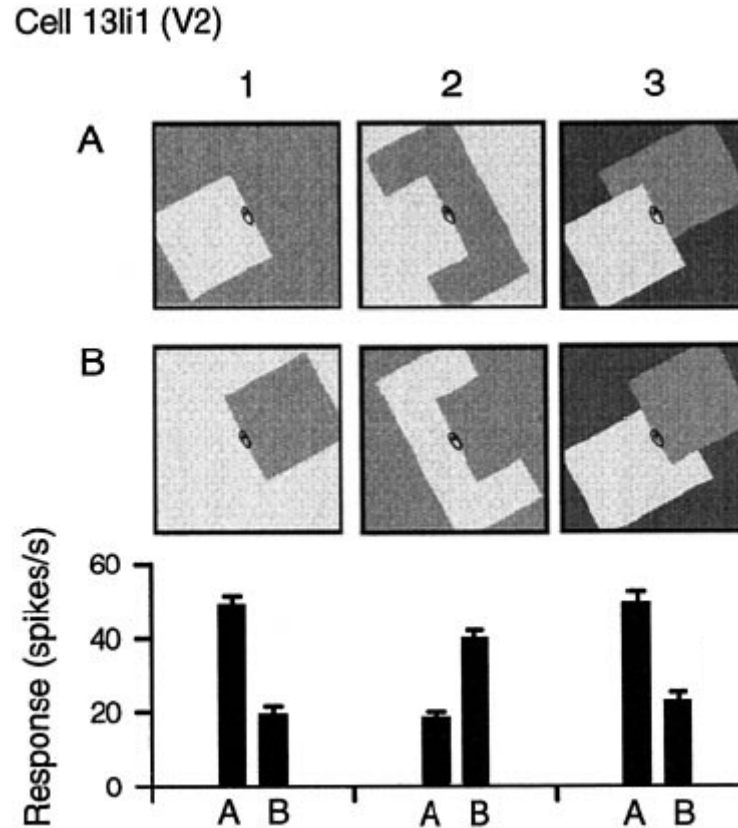


# Contrast invariance, size-invariance



Zhou, H., H. S. Friedman, and R. von der Heydt. "Coding of border ownership in monkey visual cortex." *J.Neurosci.* 20.17 (2000): 6594-611.

# Access to a Variety of Cues

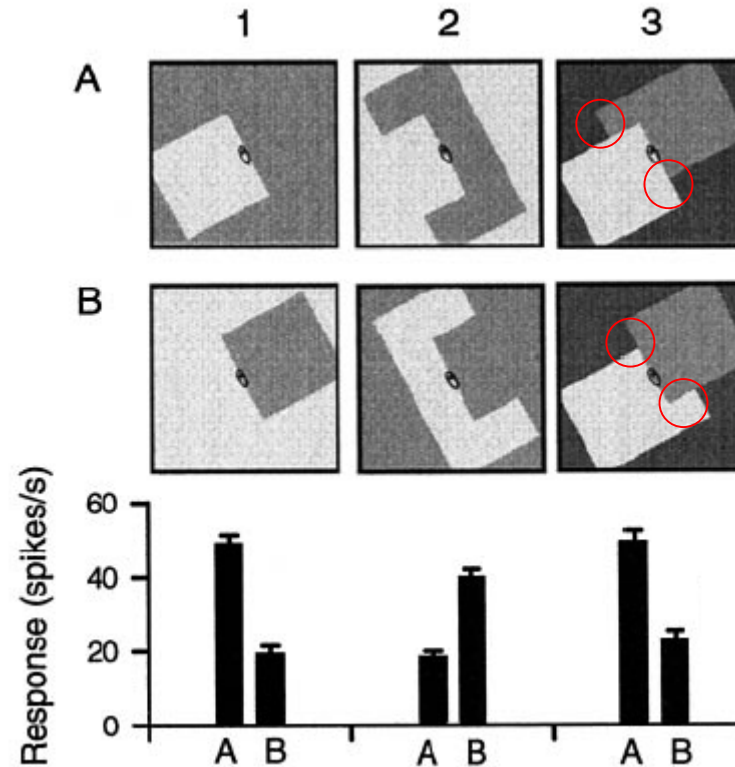


**Consistent results are obtained with different features:  
contrast, outline figures, disparity, ...**

Zhou, H., H. S. Friedman, and R. von der Heydt. "Coding of border ownership in monkey visual cortex." *J.Neurosci.* 20.17 (2000): 6594-611.

# Access to a Variety of Cues

Cell 13li1 (V2)

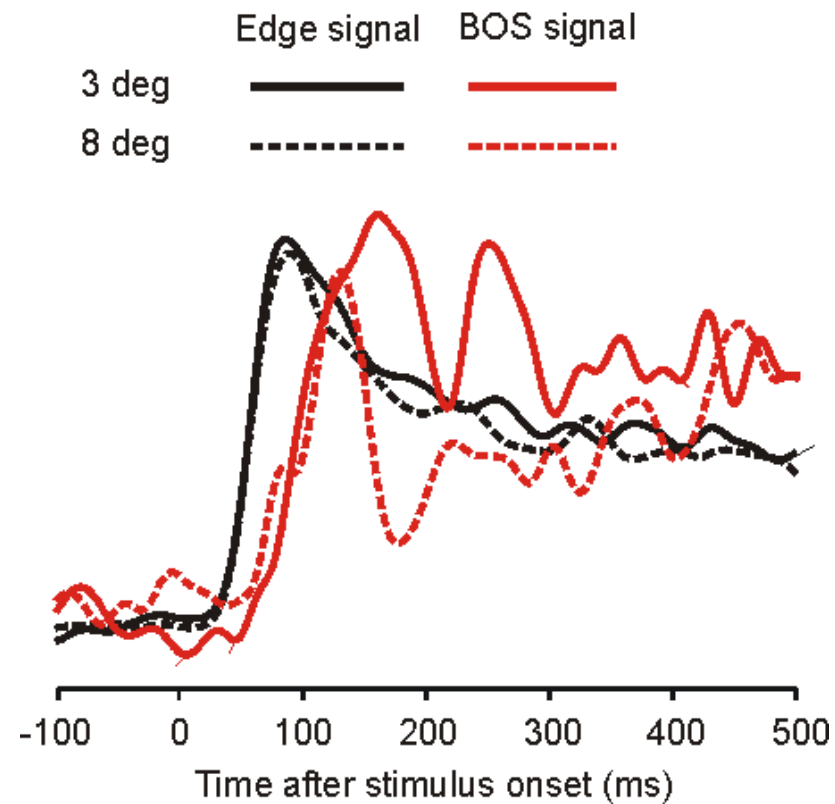
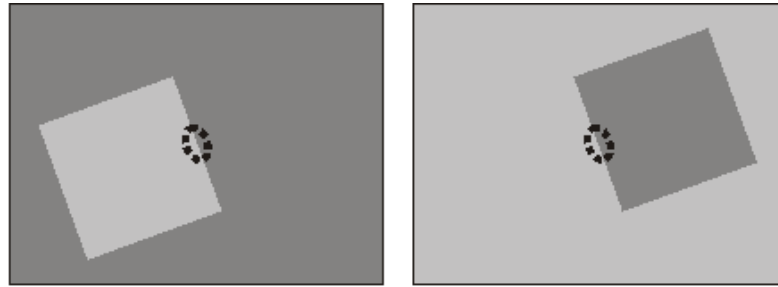


**All pixels identical except  
in outlined areas**

**Consistent results are obtained with different features:  
contrast, outline figures, disparity, ...**

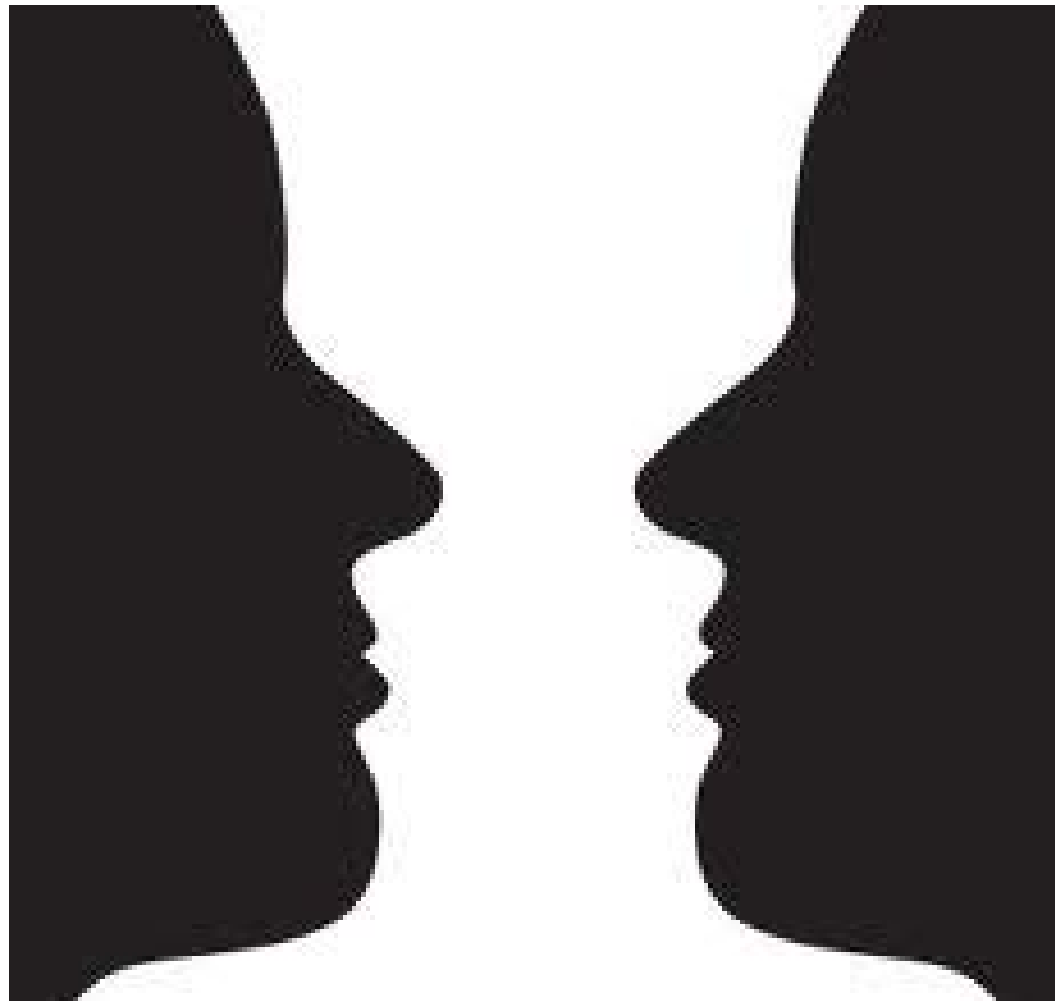
Zhou, H., H. S. Friedman, and R. von der Heydt. "Coding of border ownership in monkey visual cortex." *J.Neurosci.* 20.17 (2000): 6594-611.

# Response Latency



# Vase/Face

(E. Rubin 1915)

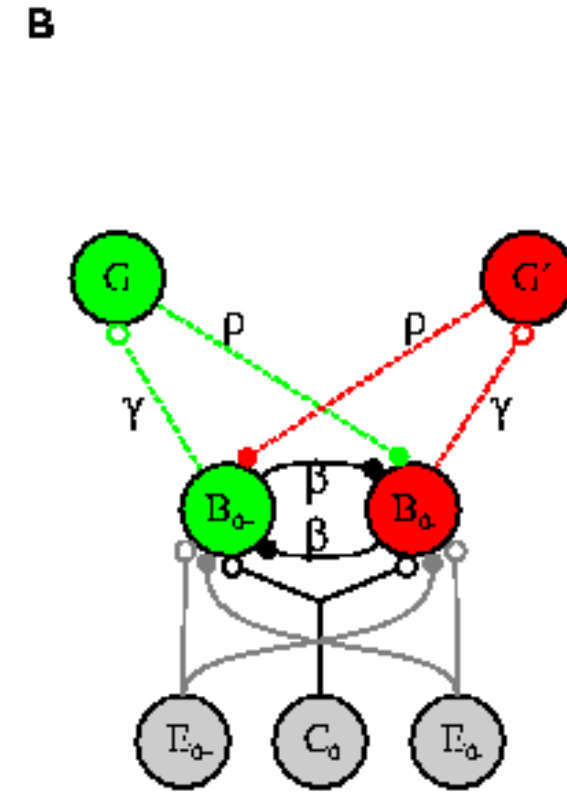
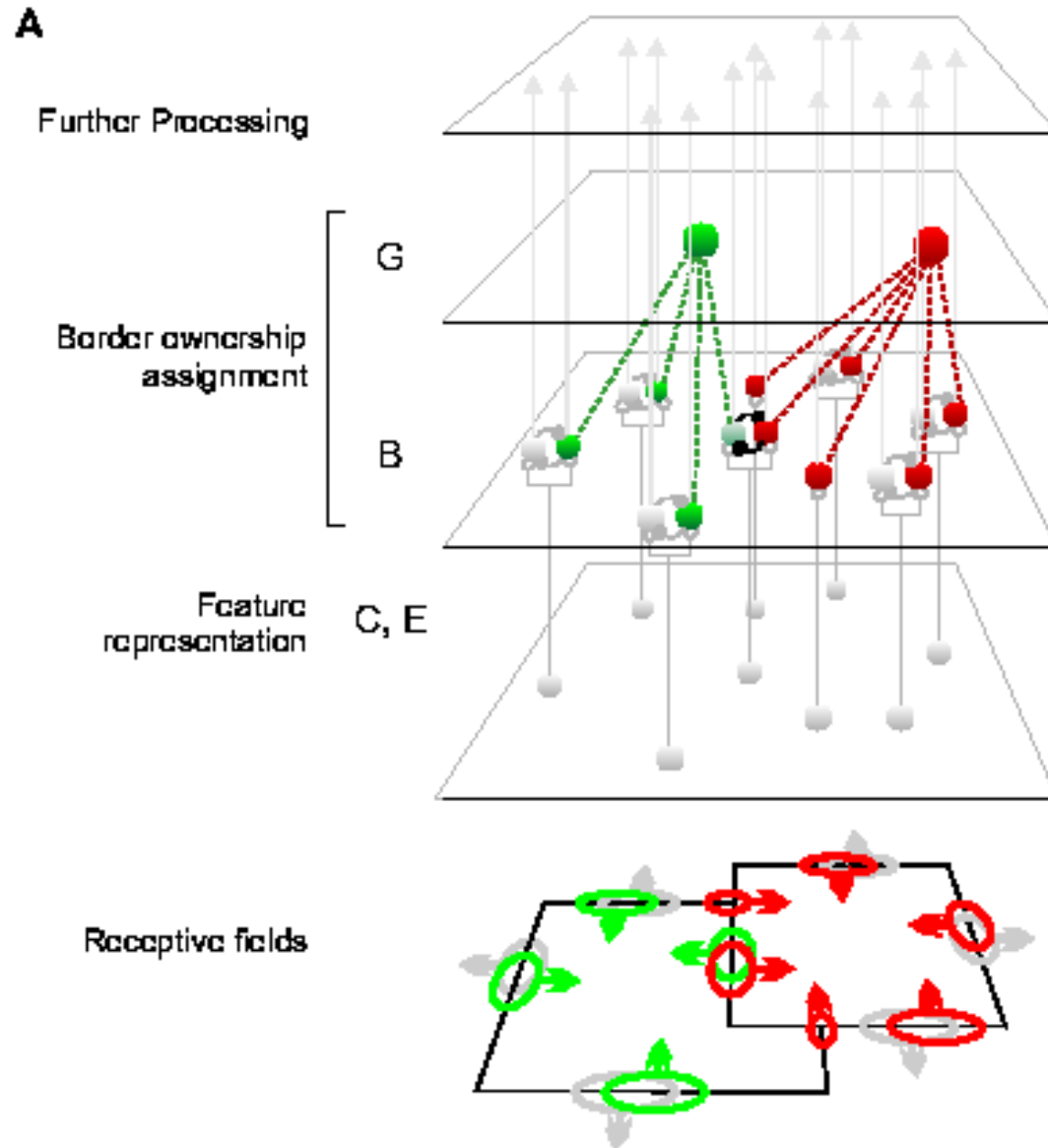


**Border ownership is mutually exclusive**

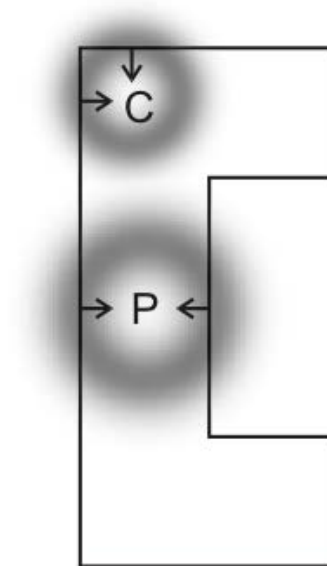
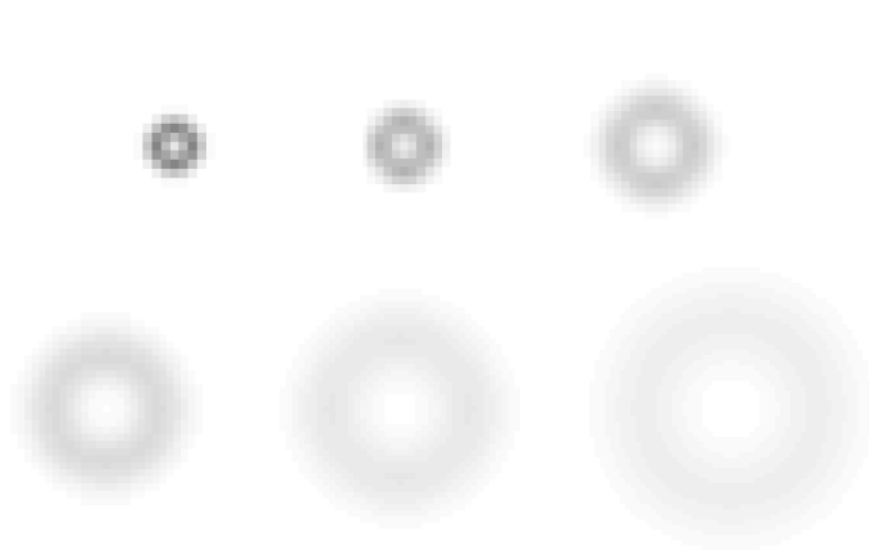
# Model Design Considerations

- **Edges of objects may be owned on either of their two sides**
- **Border ownership cells respond preferentially for a single side of ownership**
- **Border ownership cells have broad access to image context with short, fixed latencies (this rules out models based on horizontal connections)**
- **Determination of border ownership occurs independently of high-level functions such as object recognition**

# Model Architecture



***Grouping Cells:* Multi-scale  
annulus-shaped receptive fields provide  
proximity grouping and convexity preference**

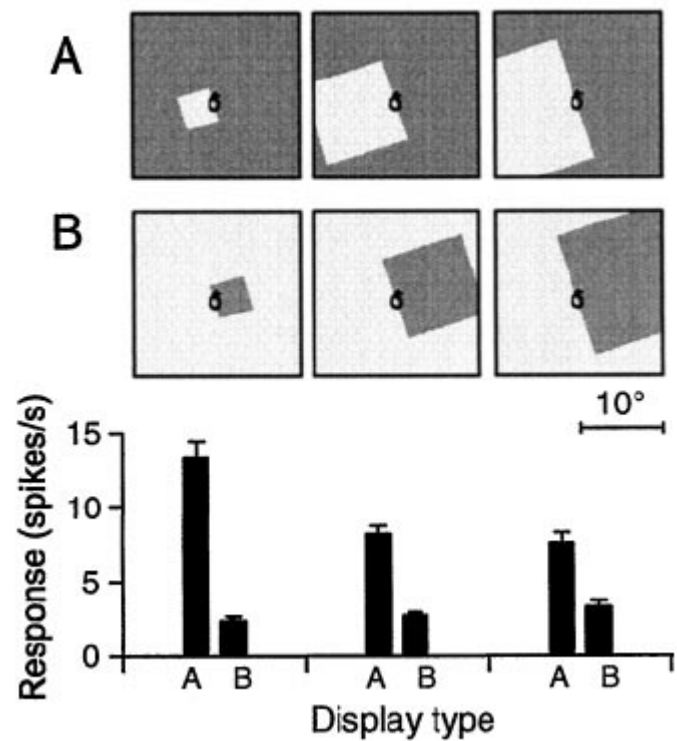


**fuzziness = robustness**

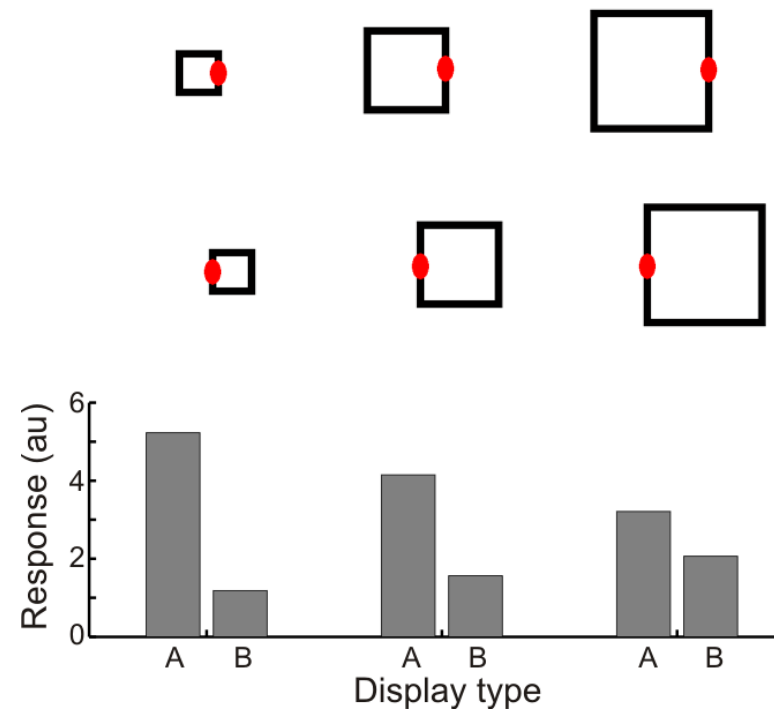


# Model Results: Size Invariance

Cell 13id4 (V2)



Model



# Model Results: Consistency Across Shapes

Cell 13li1 (V2)

Model

