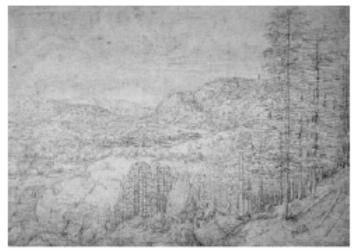
### A digital technique for art authentication

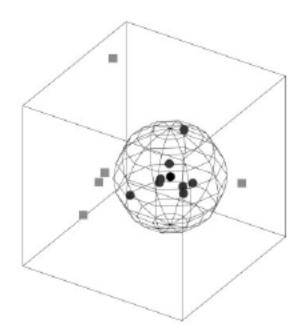
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Departments of \*Computer Science and †Mathematics, Dartmouth College, Hanover, NH 03755

Communicated by David L. Donoho, Stanford University, Stanford, CA, September 1, 2004 (received for review May 13, 2004)



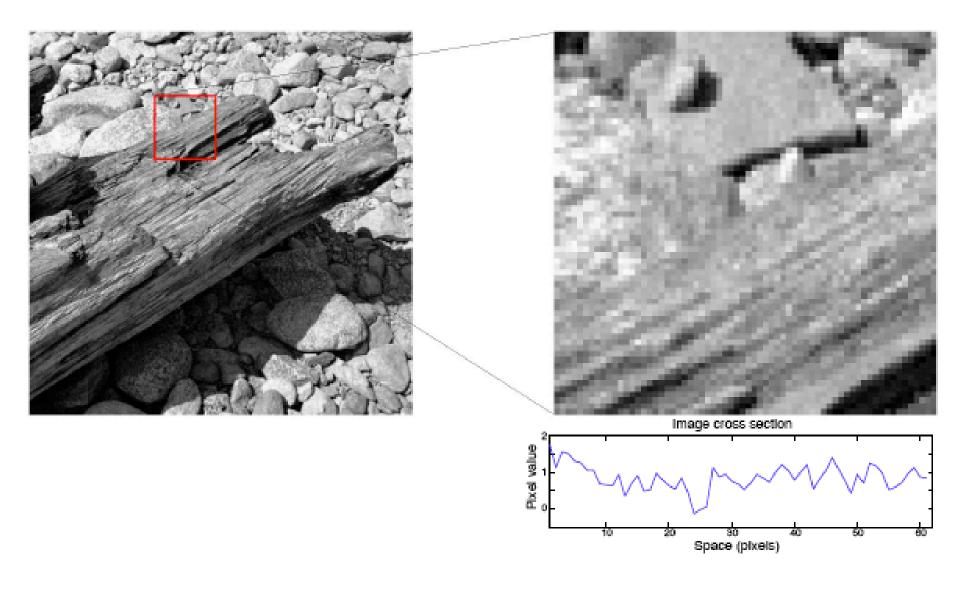




#### Towards intermediate-level representations

- The problem of scene analysis
- Insights from psychophysics
  - Occlusion and figure-ground representation (Nakayama & Shimojo)
  - Adaptation (Webster/Leopold)

#### The problem of scene analysis



### How do you interpret an edge?



### Mooney faces



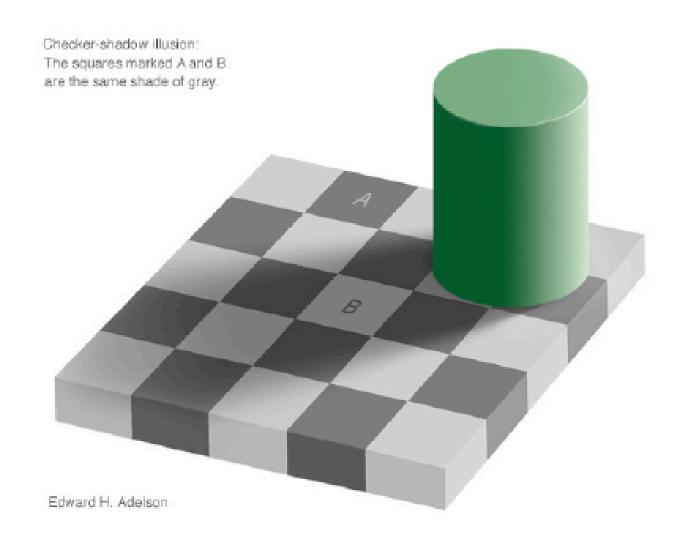




### Mooney faces



#### Lightness perception depends on 3D scene layout



### Object recognition depends on scene context



### Object recognition depends on scene context

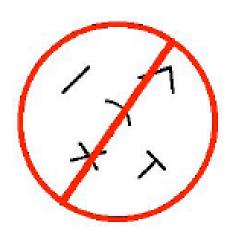


### Object recognition depends on scene context



#### Visual representations are 3D, not 2D

Nakayama K, He ZJ, and Shimojo S. (1995) Visual surface representation: a critical link between lower-level and higher level vision. In: S.M. Kosslyn and D.N. Osherson, Eds, *An Invitation to Cognitive Science*. MIT Press, pp. 1-70.



#### Images vs. surfaces

"One of the most striking things about our visual experience is how dramatically it differs from our retinal image.

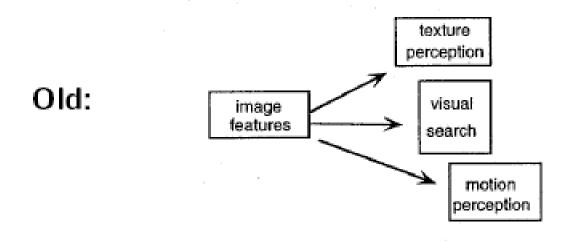
. . . .

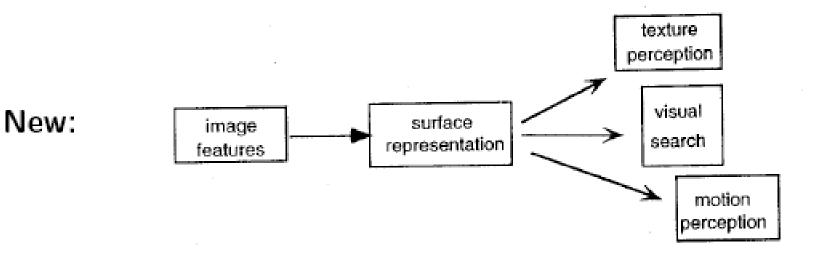
Our perception is closely tied to surfaces and objects in the real world; it does not seem tightly tied to our retinal images.

. . .

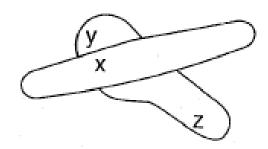
Our view is that higher functions require, as an input, a data format that explicitly represents the world as a set of surfaces."

#### A new view of visual processing



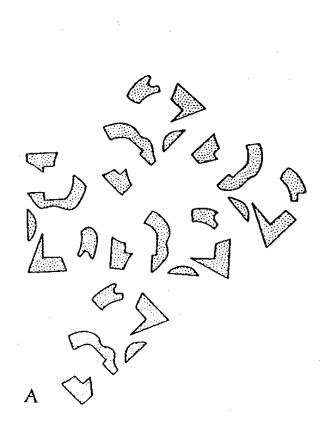


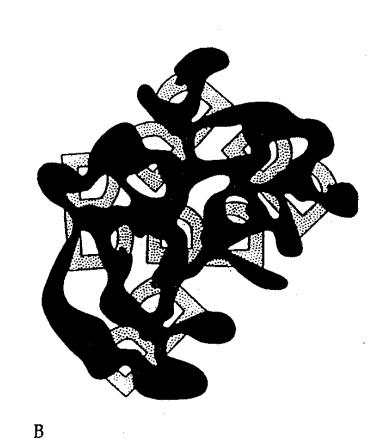
#### Rules of occlusion



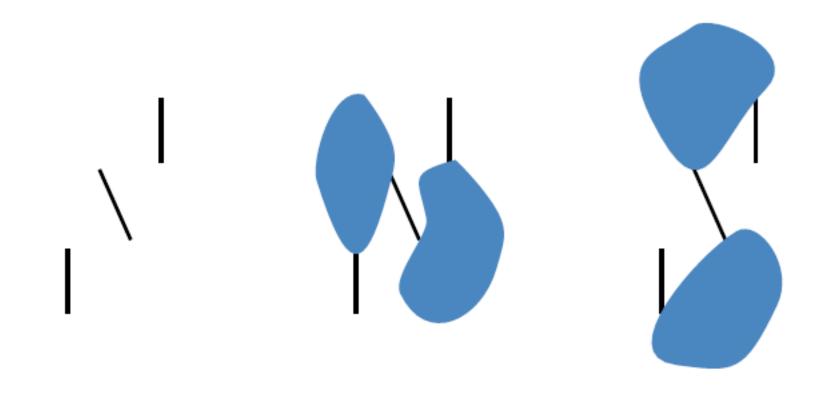
- When image regions corresponding to different surfaces meet, only one region can "own" the border between them.
- Under conditions of surface opacity, a border is owned by the region that is coded as being in front.
- A region that does not own a border is effectively unbounded. Unbounded regions can connect to other unbounded regions to form larger surfaces completing behind.

### Bregman B's

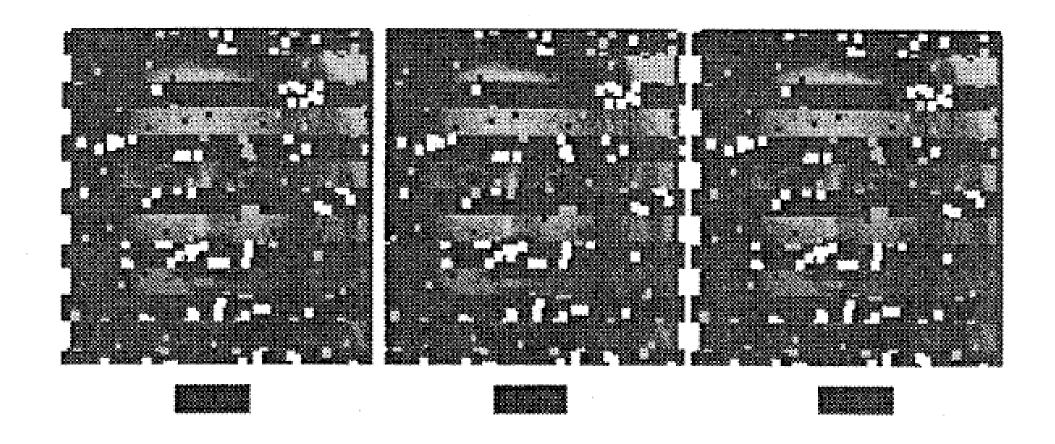




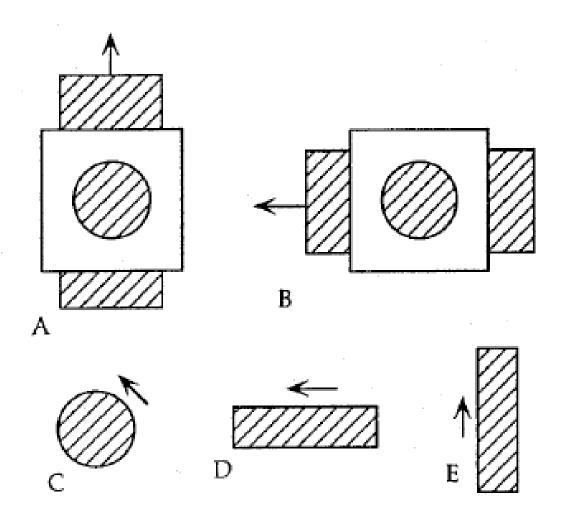
### Occluders determine object completion



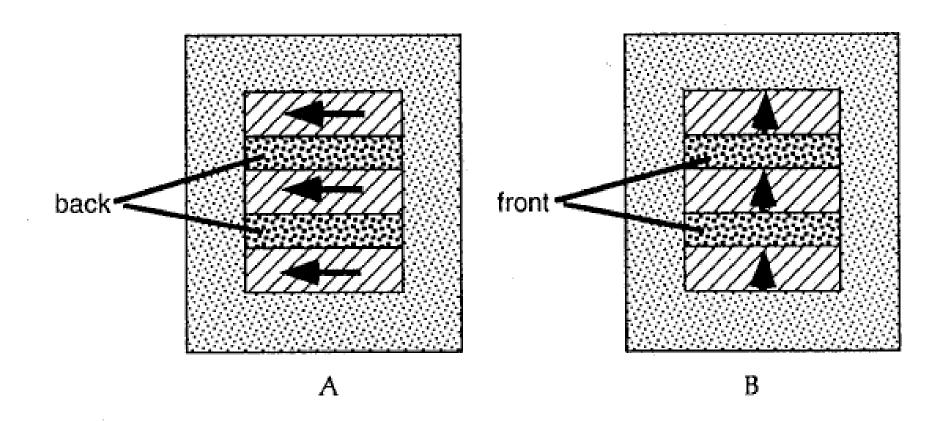
#### Amodal completion depends on depth assignment



#### The motion aperture problem



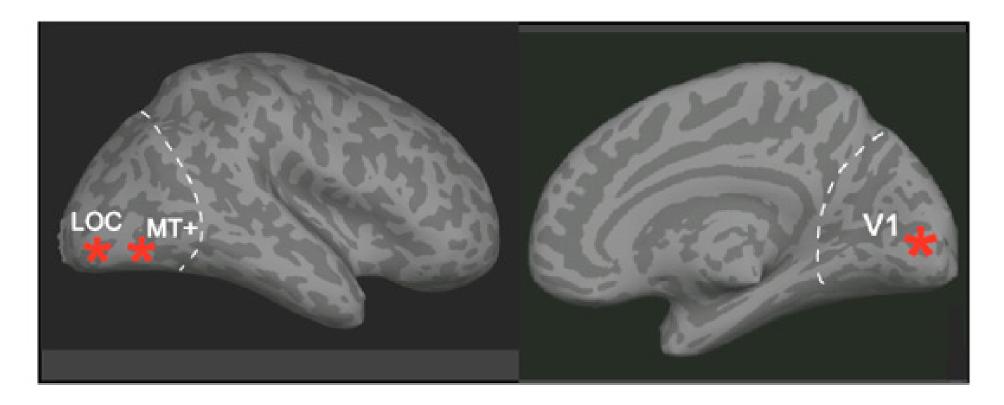
#### Motion perception depends on figure-ground assignment



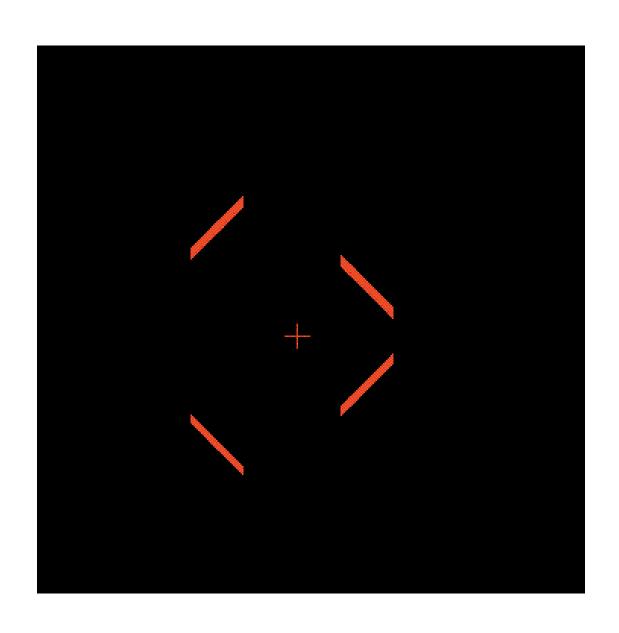
### Shape representation in human visual cortex (fMRI)

(Scott Murray - Ph.D. thesis)

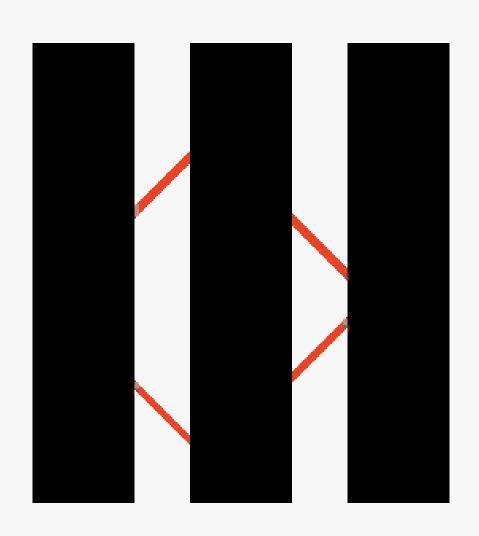
lateral medial



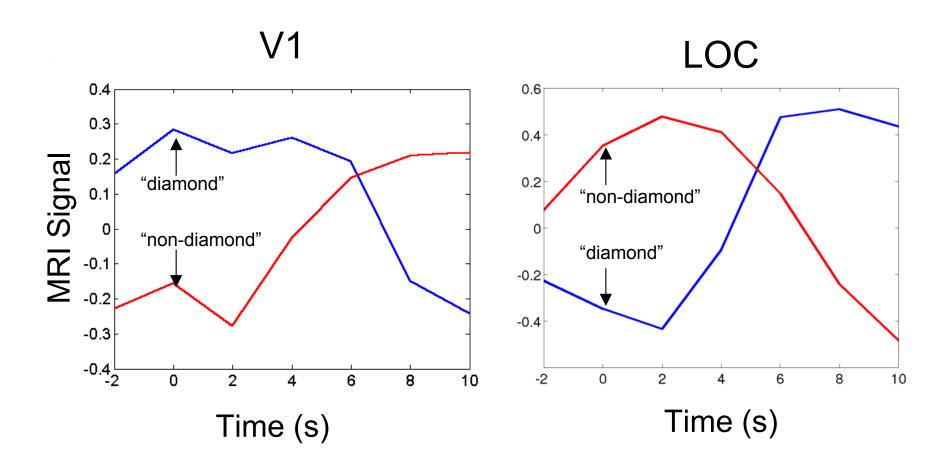
### Moving diamond behind occluders



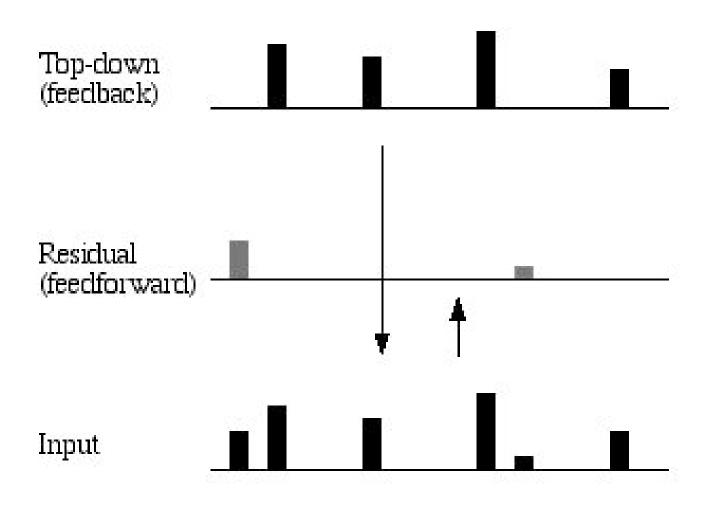
# Moving diamond behind occluders (easy version)



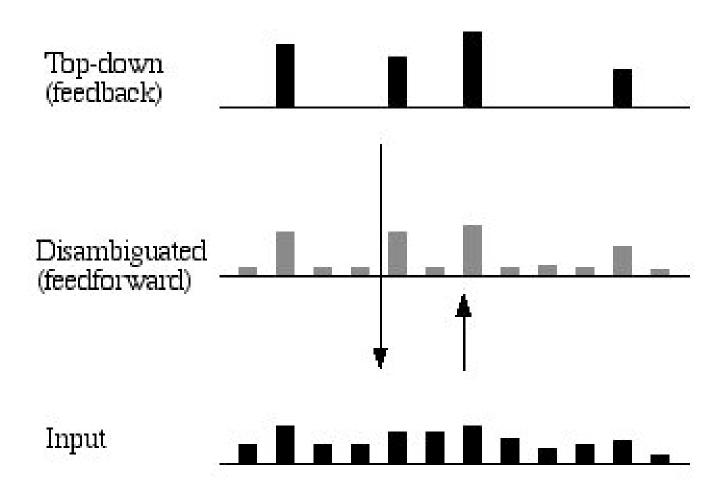
### BOLD signal: LOC vs.VI



### Predictive coding



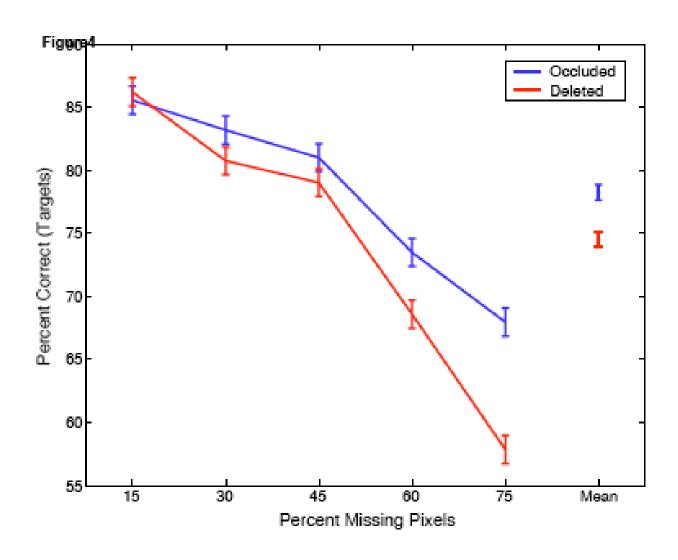
## Disambiguation



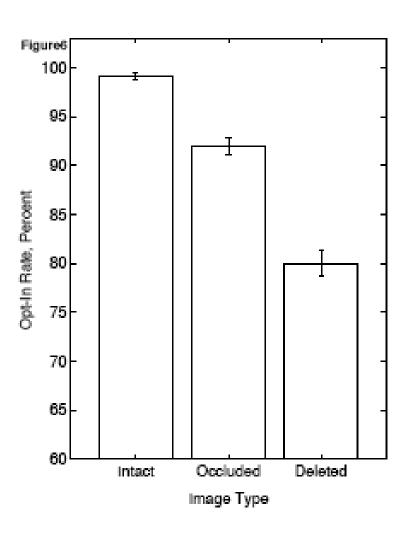
Effects of occlusion vs. deletion on recognition Jeff Johnson, Ph.D. Thesis

Figure1 Experiments 1 and 3 Experiment 3 Occluded Test Deleted Experiment 2 Occluded Deleted Intact

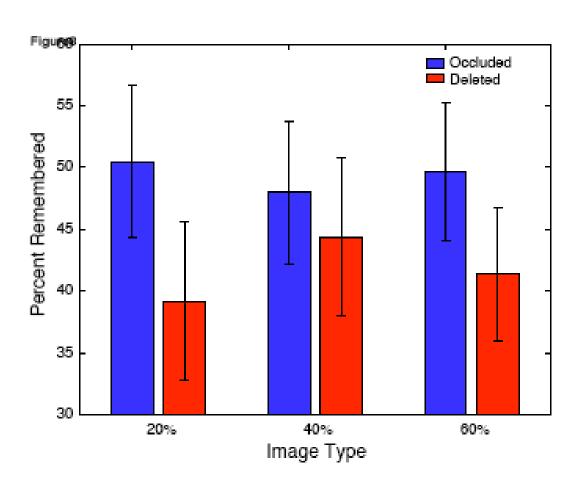
#### Recognition advantage for occlusion vs. deletion



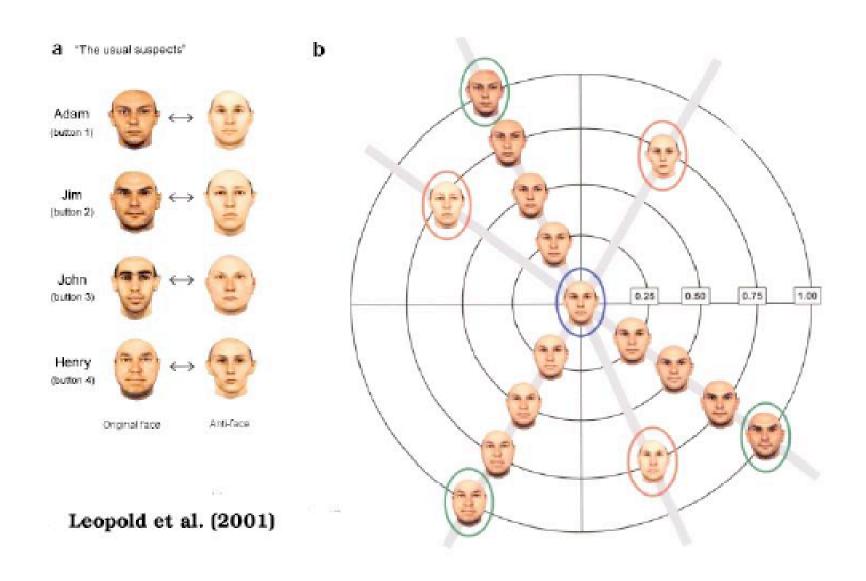
#### Higher opt-in rate



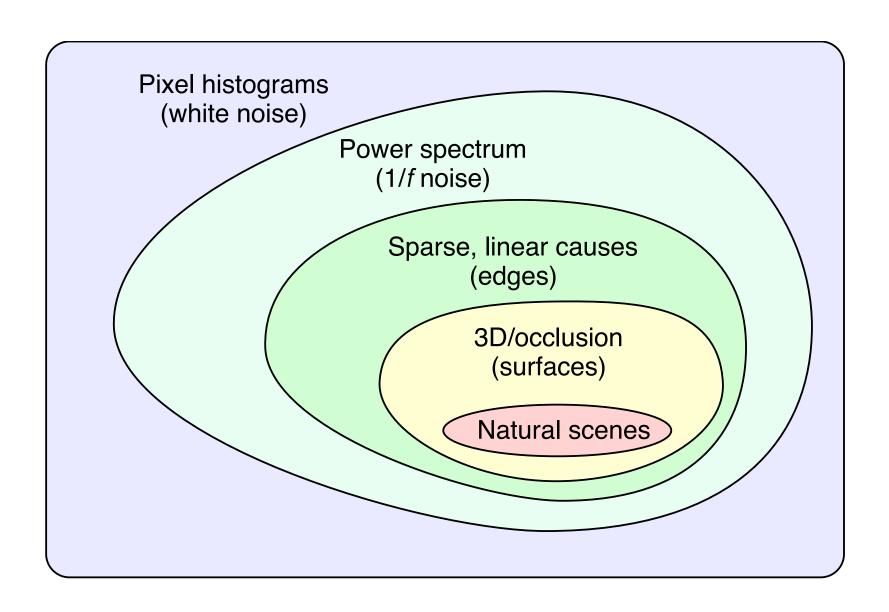
#### Occluded objects are more easily remembered



#### Adaptation reveals internal axes of representation



# Image models



# Lab 'products'

- Theories of cortical function
  - sparse representations
  - invariance
  - hierarchy and feedback
- Empirical studies
  - analysis of neural response properties
  - EEG/psychophysics of intermediate-level vision
- Applications
  - image analysis (denoising/super-resolution)
  - video compression
  - scene analysis and recognition

### Other stuff

- Fixational eye movements
- Realistic model of retina
- Crowding/lateral masking
- Tiling of amplitude and feature space
- sound2image