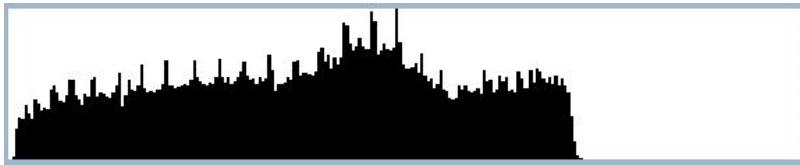


# Photometric Processing

# Histogram

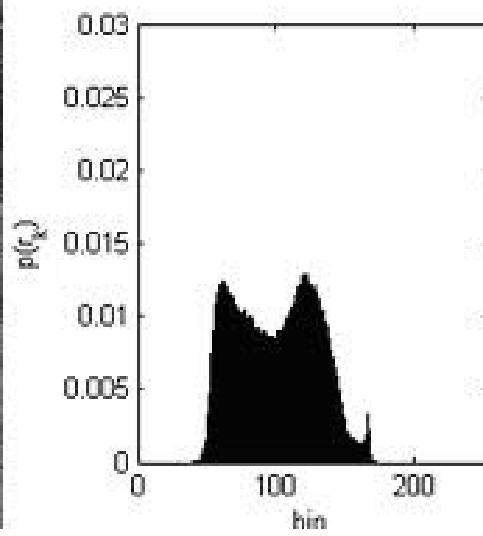
- Probability distribution of the different grays in an image

$$p(x_i) = \frac{n_i}{n}$$



# Contrast Enhancement

- Limited gray levels are used
- Hence, low contrast
- Enhance contrast

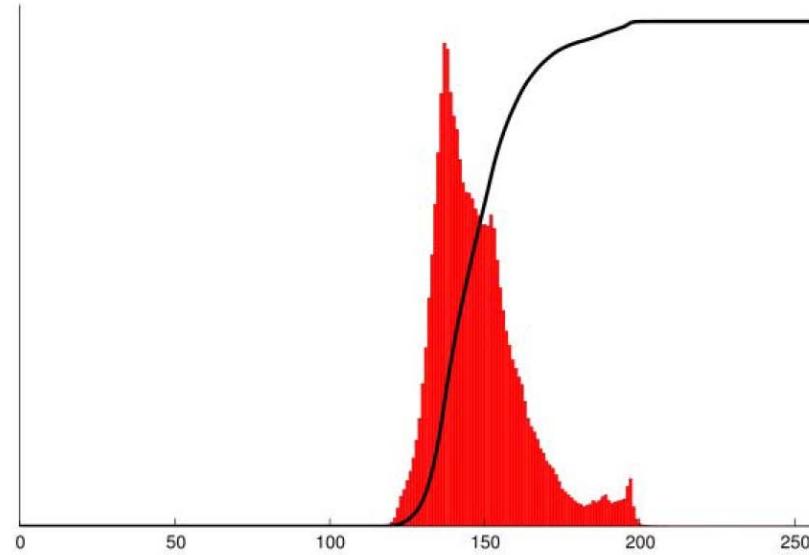


# Histogram Stretching

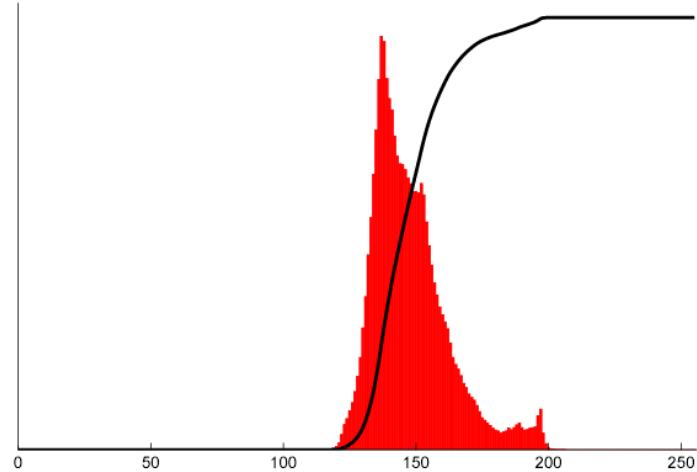
$$c(i) = \sum_{j=0}^i p(x_j)$$

- Monotonically increasing function between 0 and 1
- $c(0) = 0$
- $c(1) = 1$

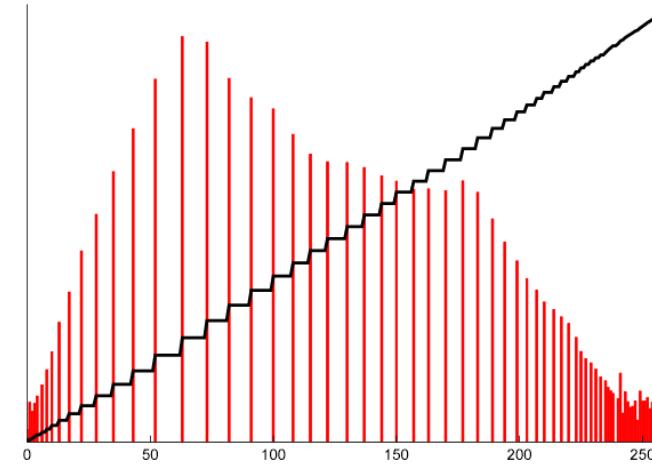
$$y_i = T(x_i) = c(i)$$



# Results



# Results

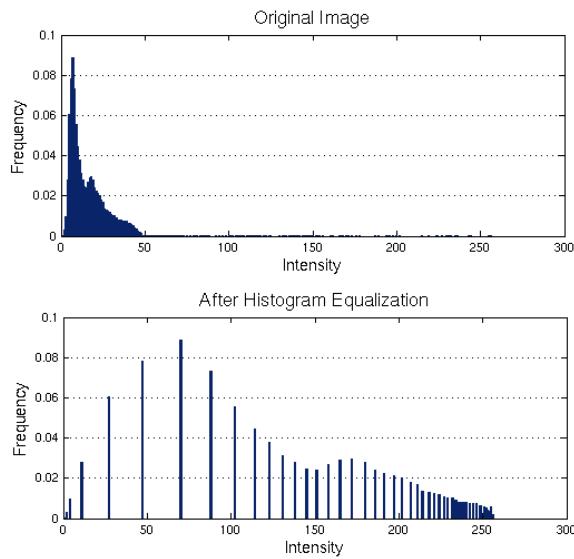
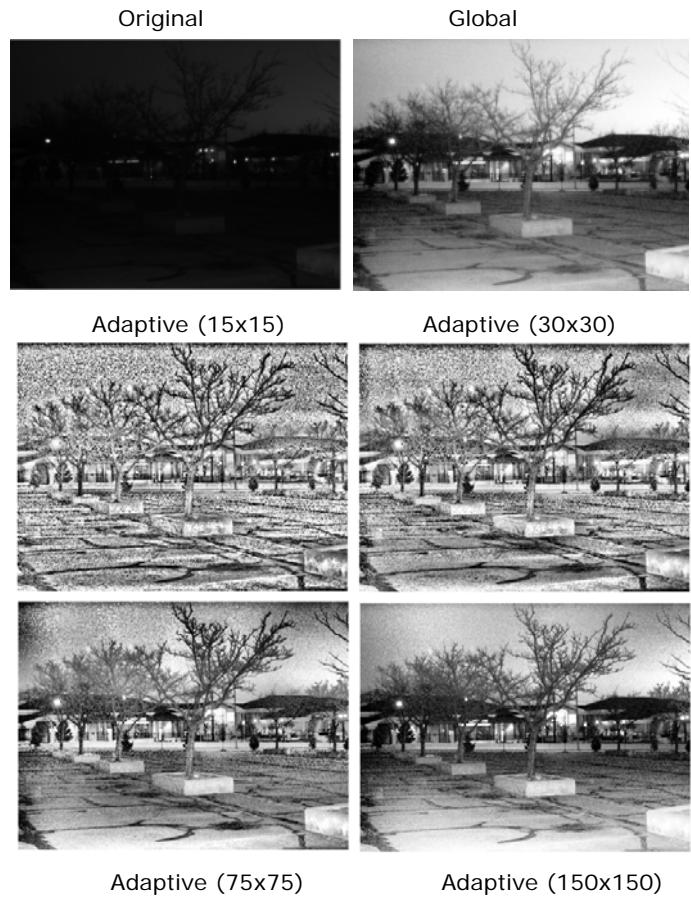


Burn out effects

# Adaptive Histogram Stretching

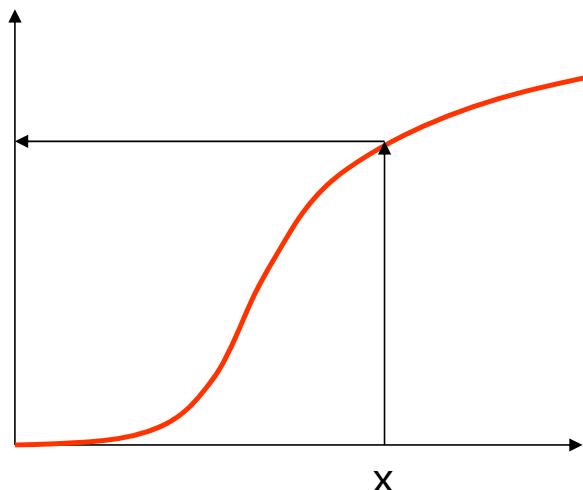
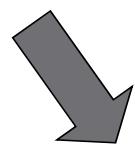
- Choose a neighborhood
- Apply histogram equalization to the pixels in that window
- Replace the center pixel with the histogram equalized value
- Do this for all pixels
- Compute intensive
- Leads to noise

# Results

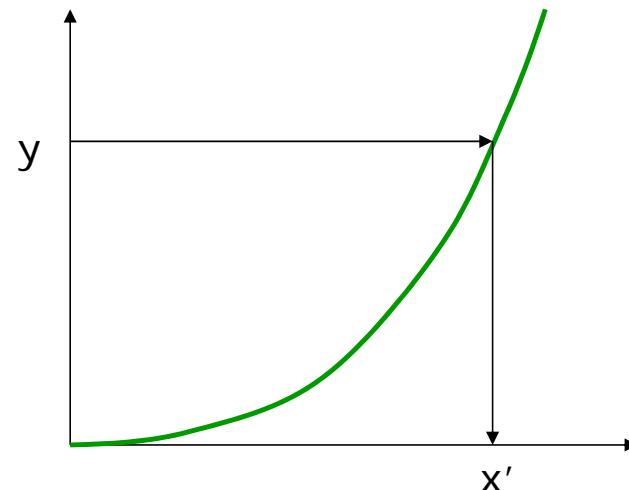
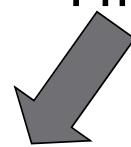


# Histogram Matching

Histogram 1



Histogram 2



# Appearance Transfer



# Image Compositing



Mosaic Blending

# Image Compositing



# Compositing Procedure

1. Extract Sprites (e.g using Intelligent Scissors in Photoshop)

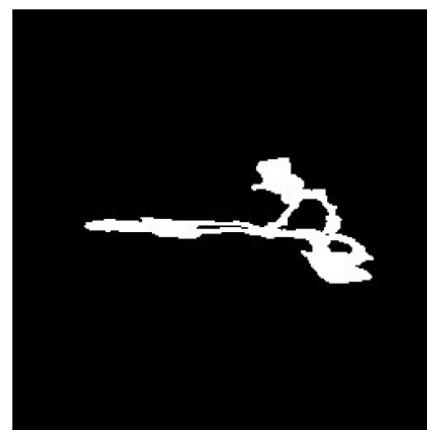
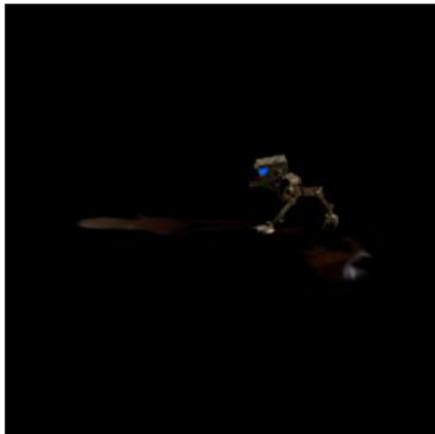


2. Blend them into the composite (in the right order)



Composite by  
David Dewey

# Replacing pixels rarely works

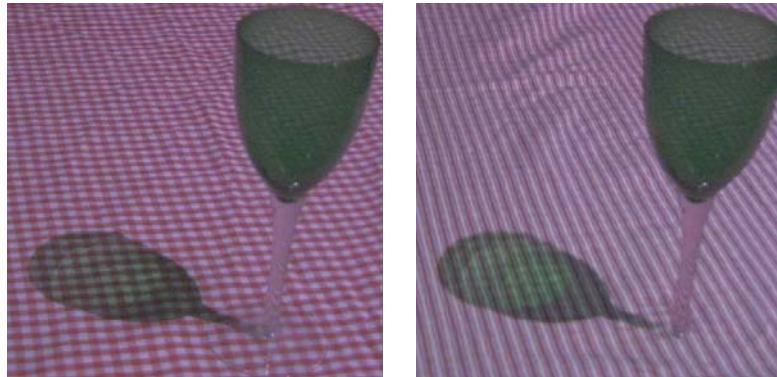


Binary  
mask



Problems: boundaries & transparency (shadows)

## Two Problems:



Semi-transparent objects

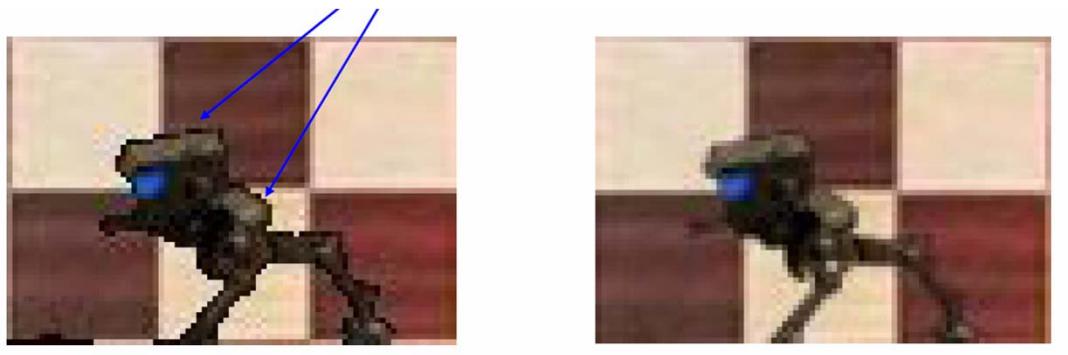


Pixels too large

# Alpha Channel

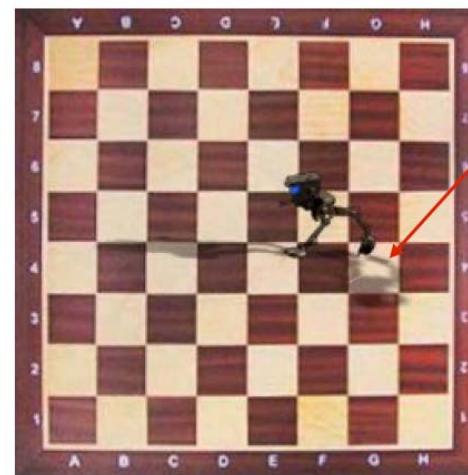
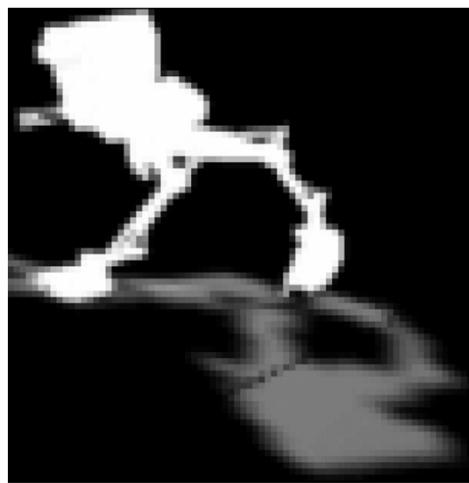
- Add one more channel:
  - `Image(R,G,B,alpha)`
- Encodes transparency (or pixel coverage):
  - Alpha = 1: opaque object (complete coverage)
  - Alpha = 0: transparent object (no coverage)
  - $0 < \text{Alpha} < 1$ : semi-transparent (partial coverage)
- Example:  $\text{alpha} = 0.3$

# Alpha Blending



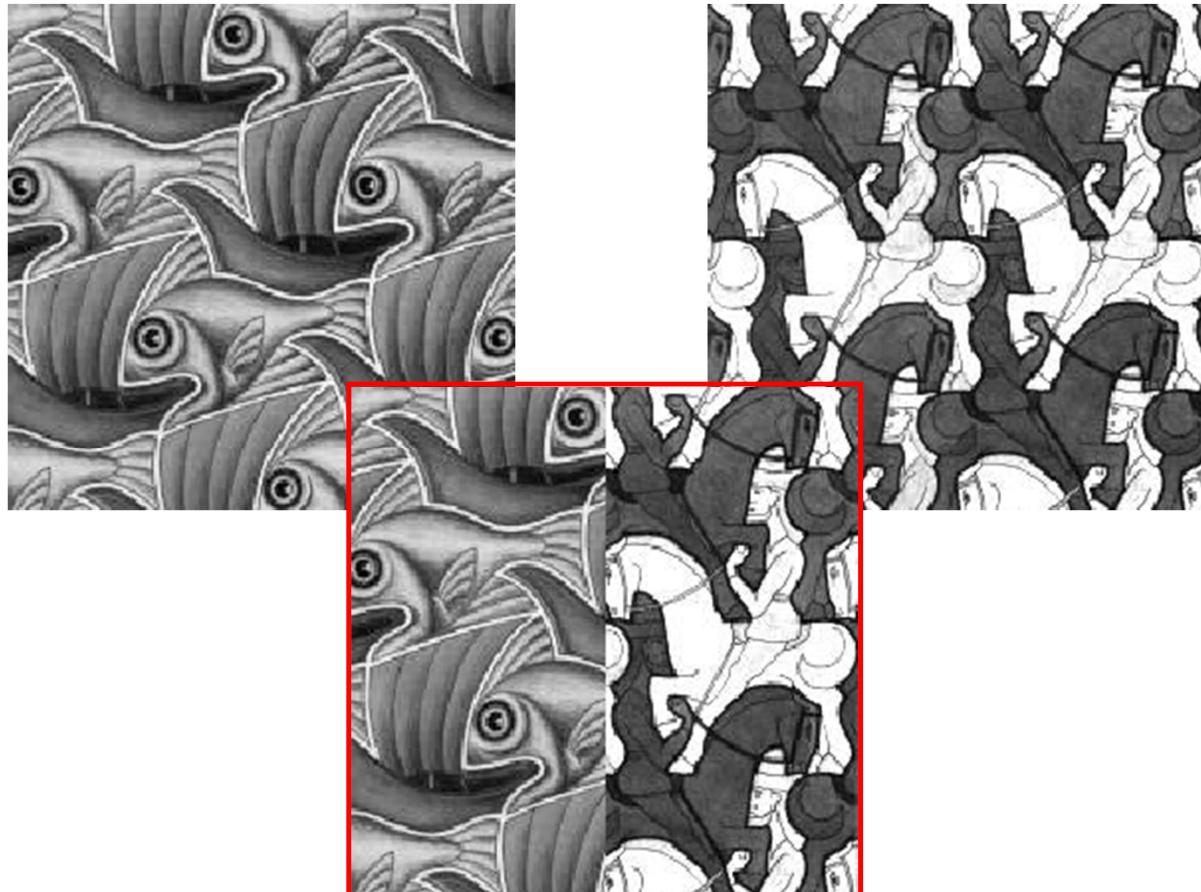
$$I_{\text{comp}} = \alpha I_{\text{fg}} + (1-\alpha) I_{\text{bg}}$$

alpha  
mask



shadow

# Alpha Hacking...



No physical interpretation, but it smoothes the seams

# Feathering



+



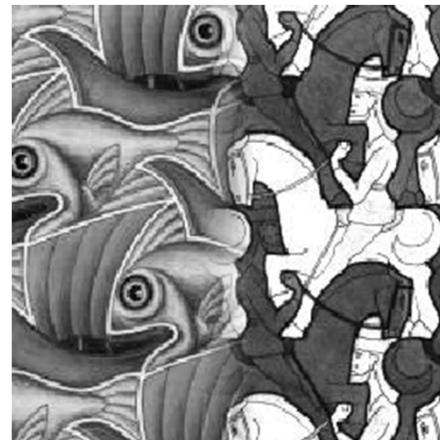
1-

0-

1-

0-

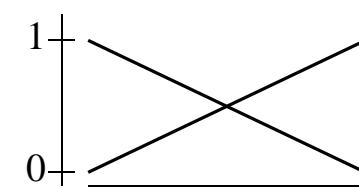
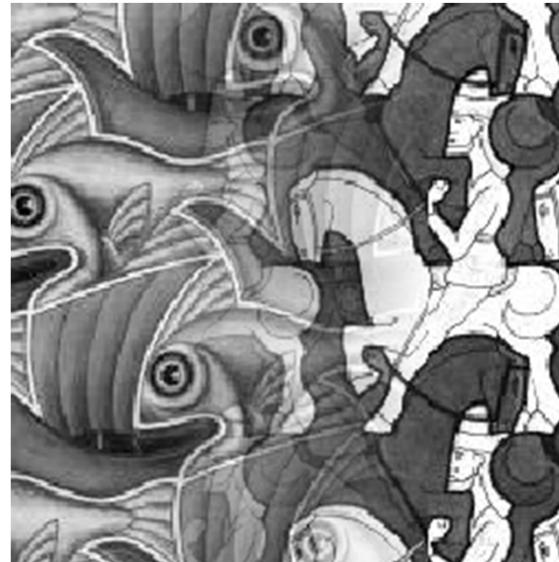
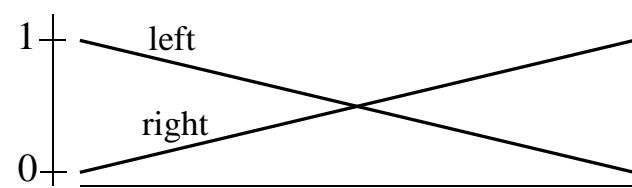
==



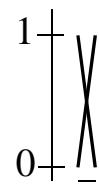
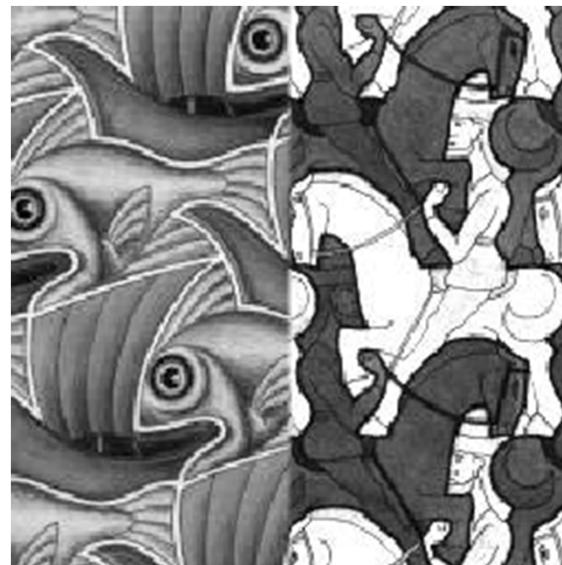
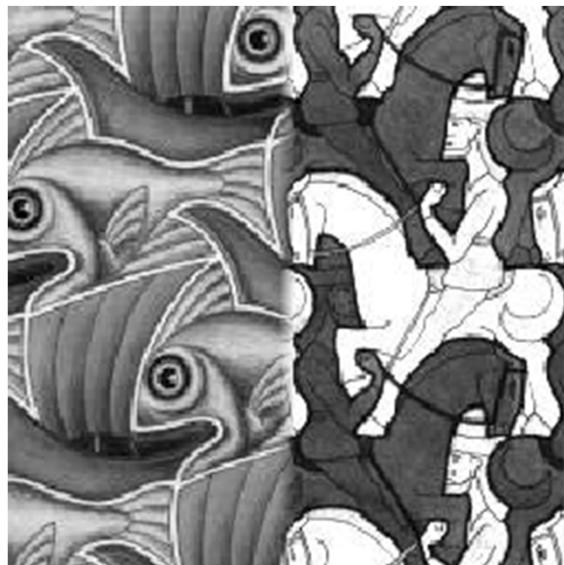
Encoding as transparency

$$I_{\text{blend}} = \alpha I_{\text{left}} + (1-\alpha) I_{\text{right}}$$

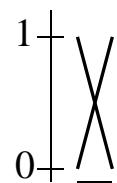
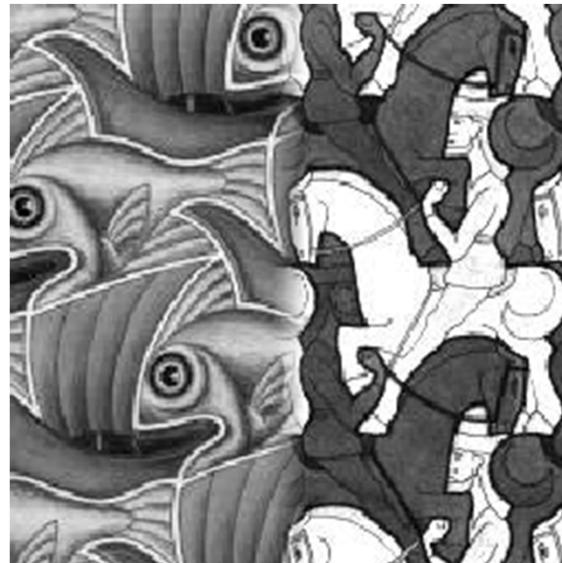
# Affect of Window Size



# Affect of Window Size

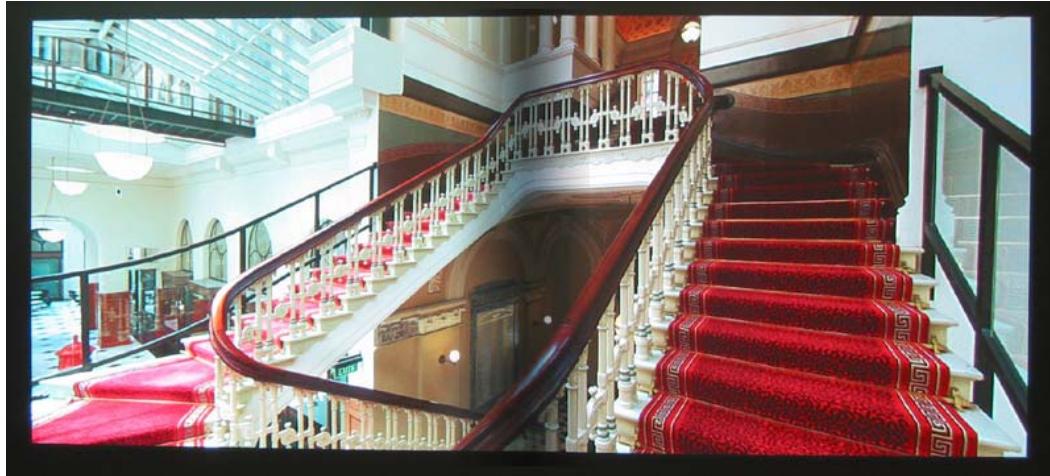


# Good Window Size



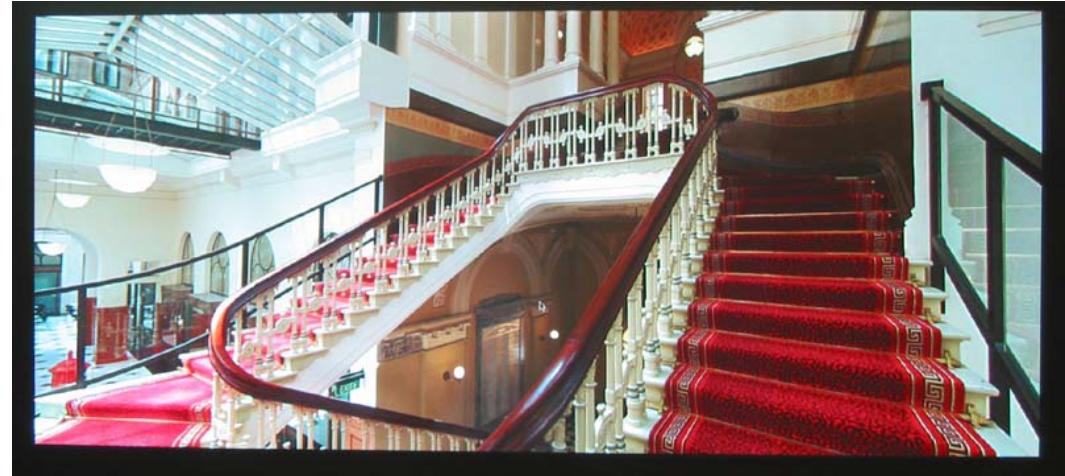
“Optimal” Window: smooth but not ghosted

# Type of Blending function



Linear  
(Only function continuity)

Spline or Cosine  
(Gradient continuity also)

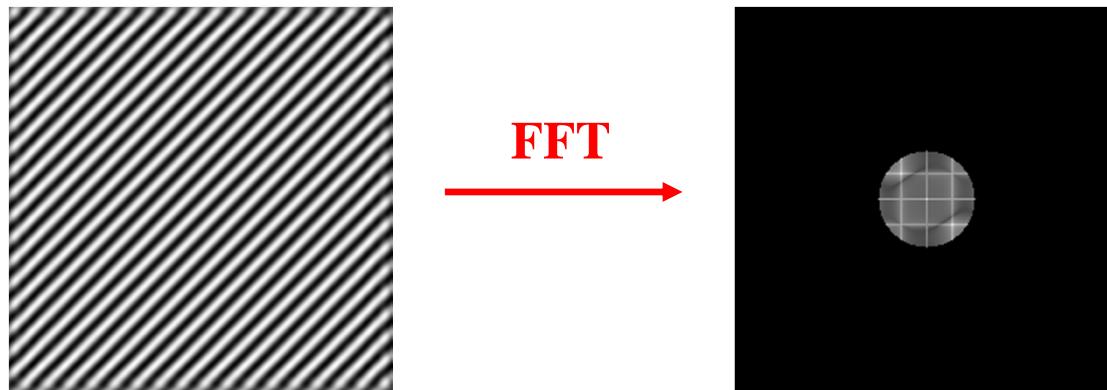


# What is the Optimal Window?

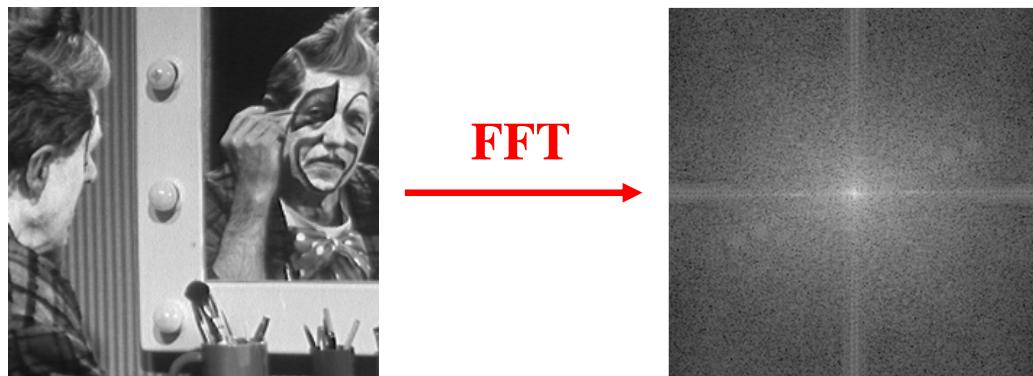
- To avoid seams
  - window = size of largest prominent feature
- To avoid ghosting
  - window  $\leq 2 \times$  size of smallest prominent feature

Natural to cast this in the *Fourier domain*

- largest frequency  $\leq 2 \times$  size of smallest frequency
- image frequency content should occupy one “octave” (power of two)



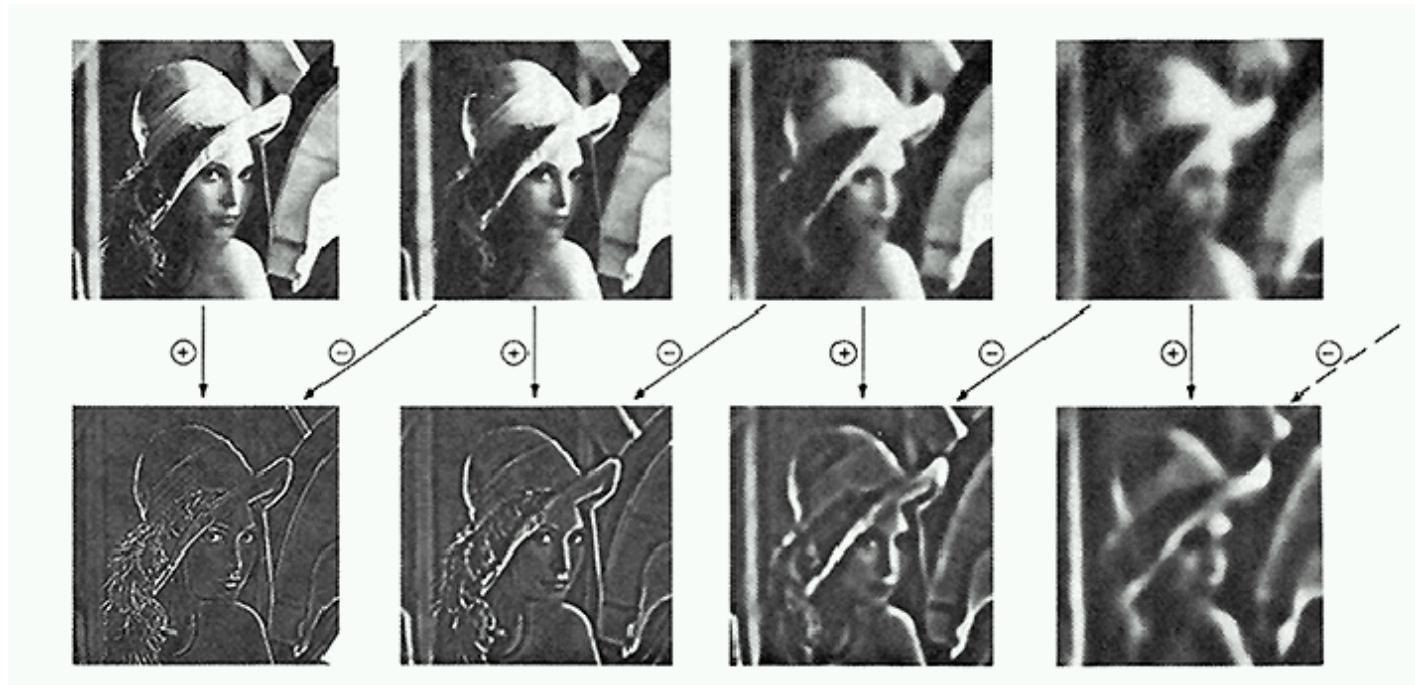
# Frequency Spread is Wide



- Idea (Burt and Adelson)
  - Compute Band pass images for L and R
    - Decomposes Fourier image into octaves (bands)
  - Feather corresponding octaves  $L^i$  with  $R^i$ 
    - Splines matched with the image frequency content
    - Multi-resolution splines
    - If resolution is changed, the width can be the same
  - Sum feathered octave images

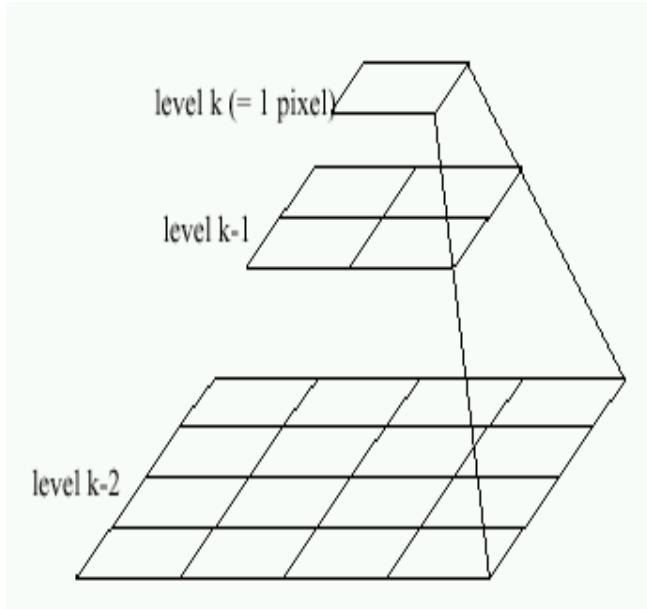
# Octaves in the Spatial Domain

## Lowpass Images

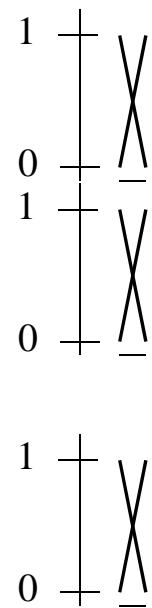


- Bandpass Images

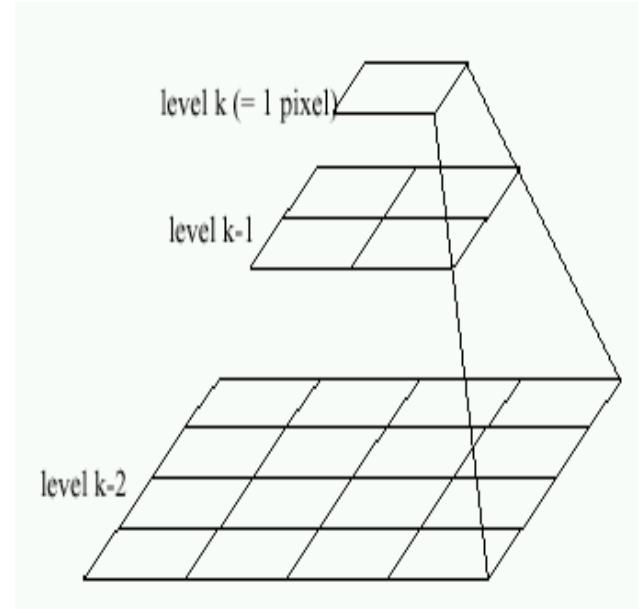
# Pyramid Blending



Left pyramid

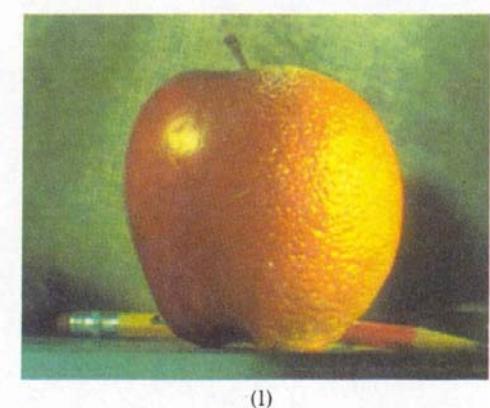
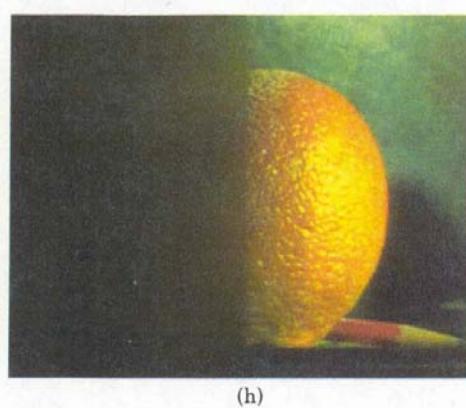
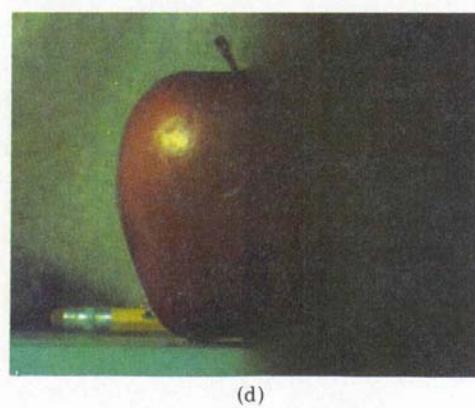
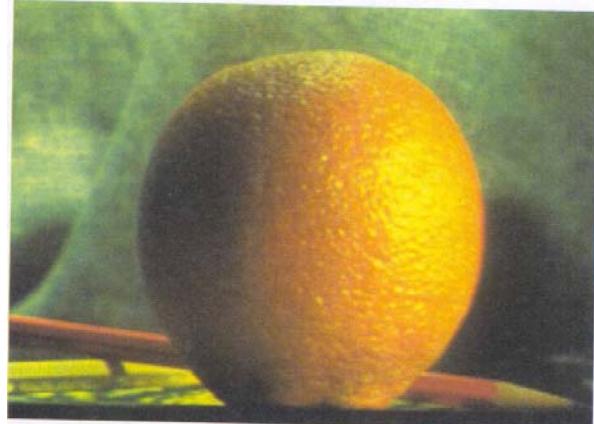
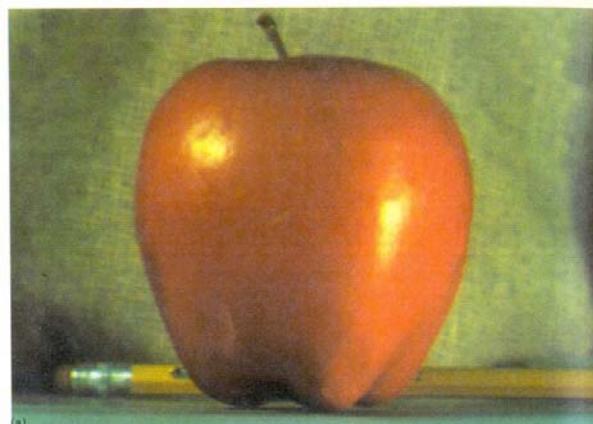


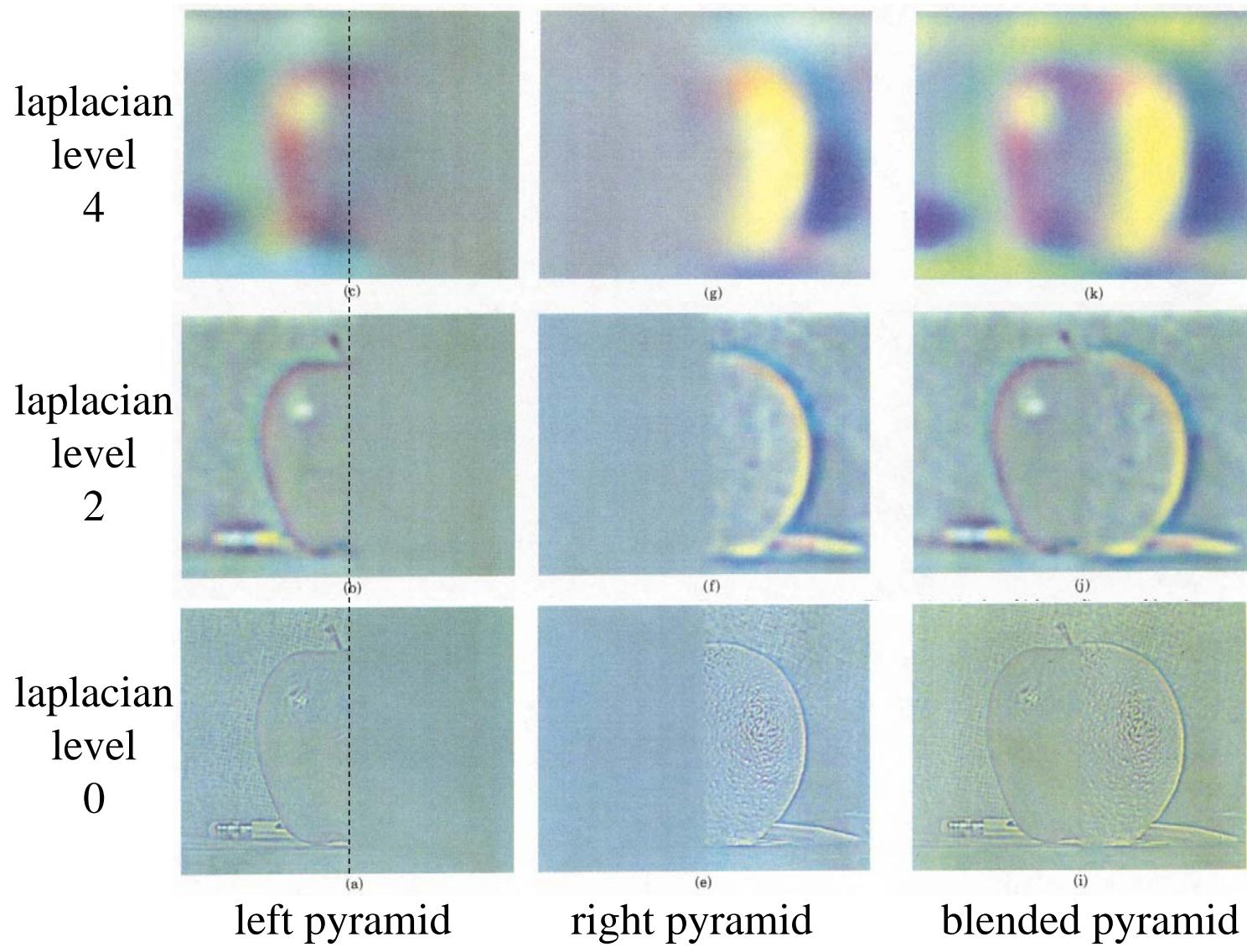
blend



Right pyramid

# Pyramid Blending





# Laplacian Pyramid: Blending

- General Approach:
  1. Build Laplacian pyramids LA and LB from images A and B
  2. Build a Gaussian pyramid GR from selected region R
  3. Form a combined pyramid LS from LA and LB using nodes of GR as weights:
    - $LS(i,j) = GR(i,j) * LA(I,j) + (1 - GR(i,j)) * LB(I,j)$
  4. Collapse the LS pyramid to get the final blended image

# Don't Blend, CUT!



Moving objects become ghosts

- So far we only tried to blend between two images. What about finding an optimal seam?

# Davis 1998

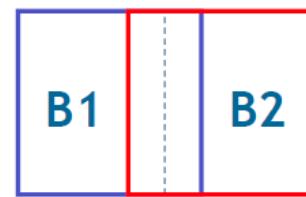
- Segment into regions
  - Single source per region
  - Avoid artifacts along the boundary
  - Dijkstra's shortest path method



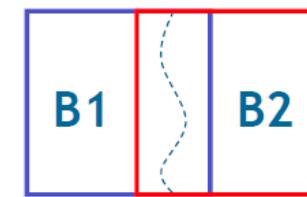
# Eros and Freeman 2001



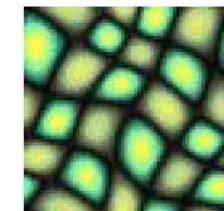
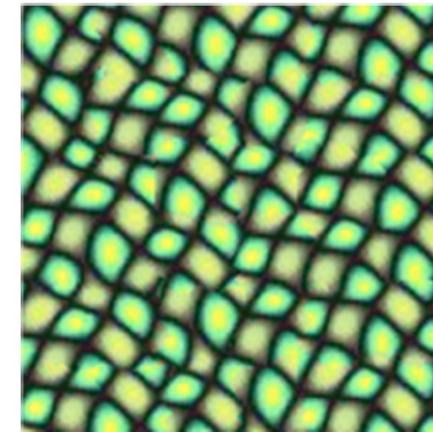
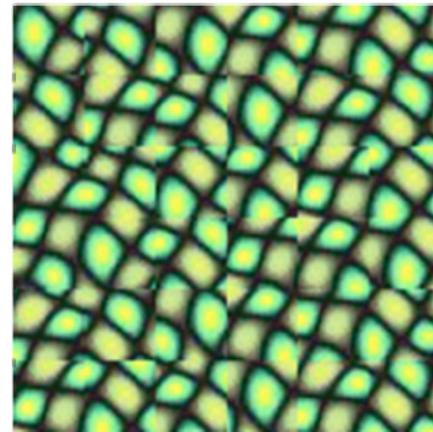
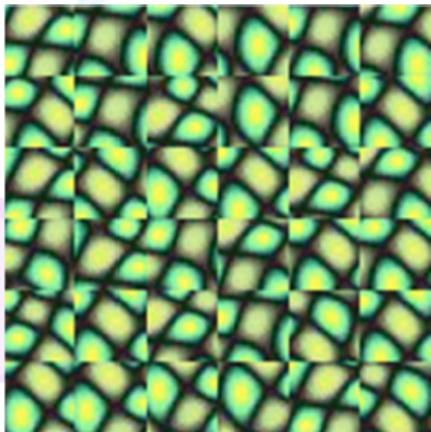
Random placement  
of blocks



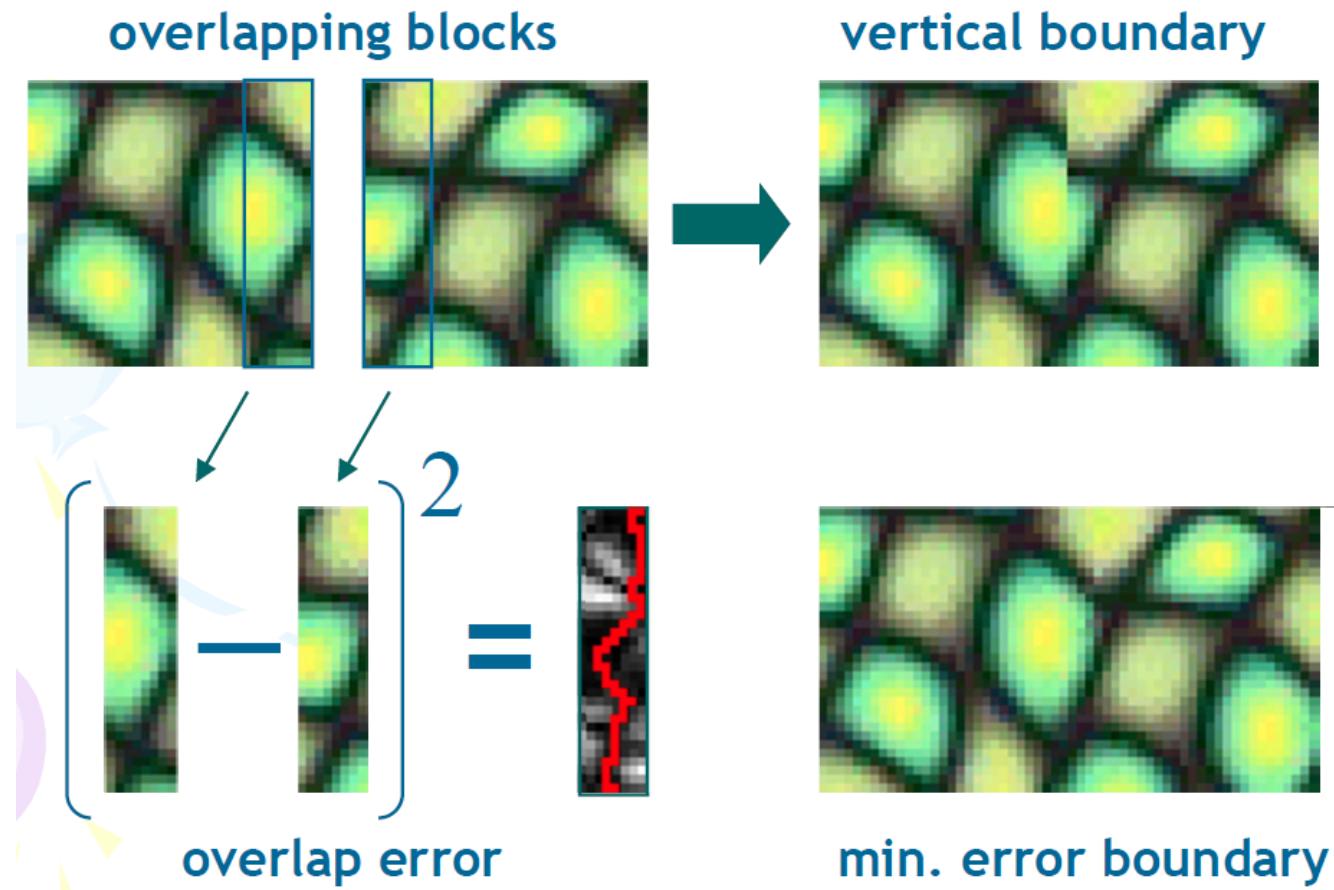
Neighboring blocks  
constrained by overlap



Minimal error  
boundary cut



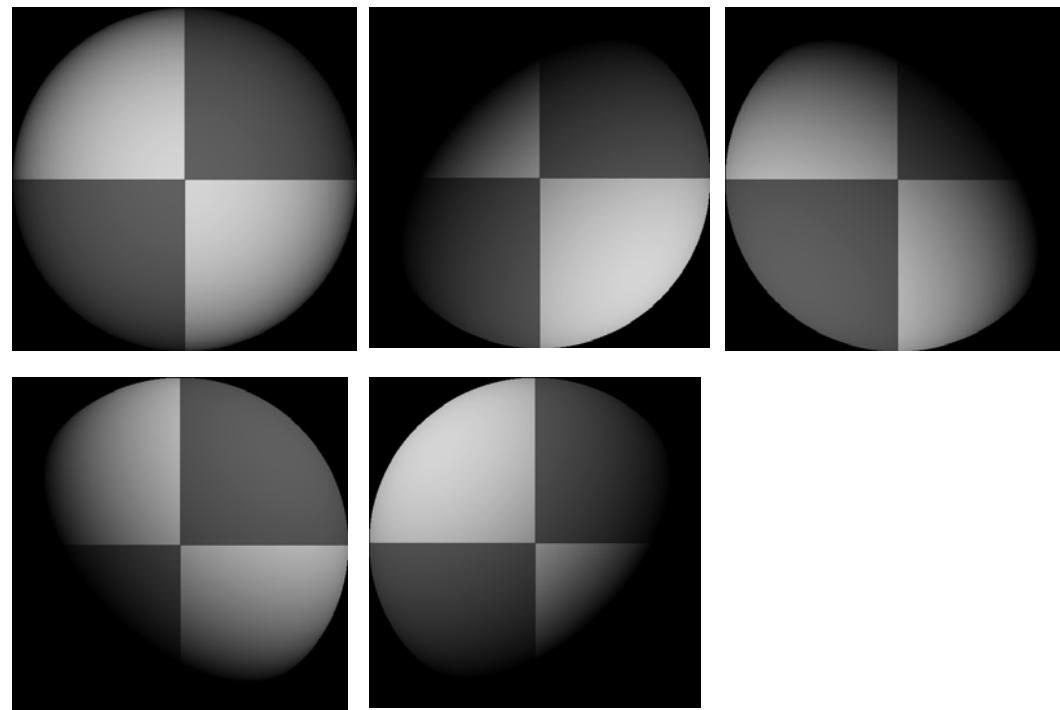
# Minimum Error Boundary



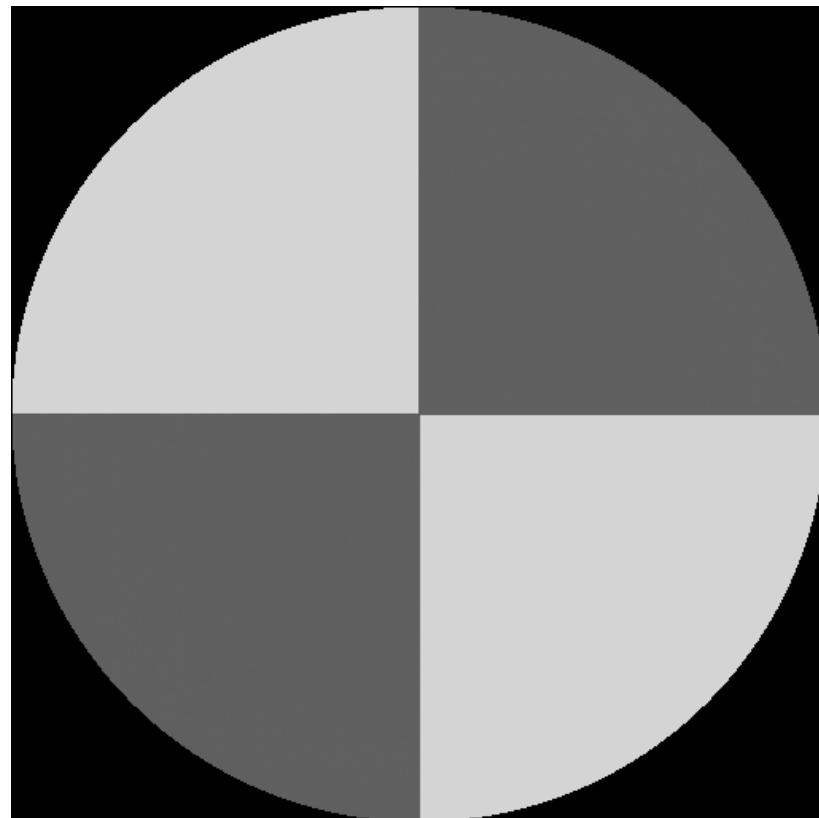
# Photometric Stereo

# Example figures

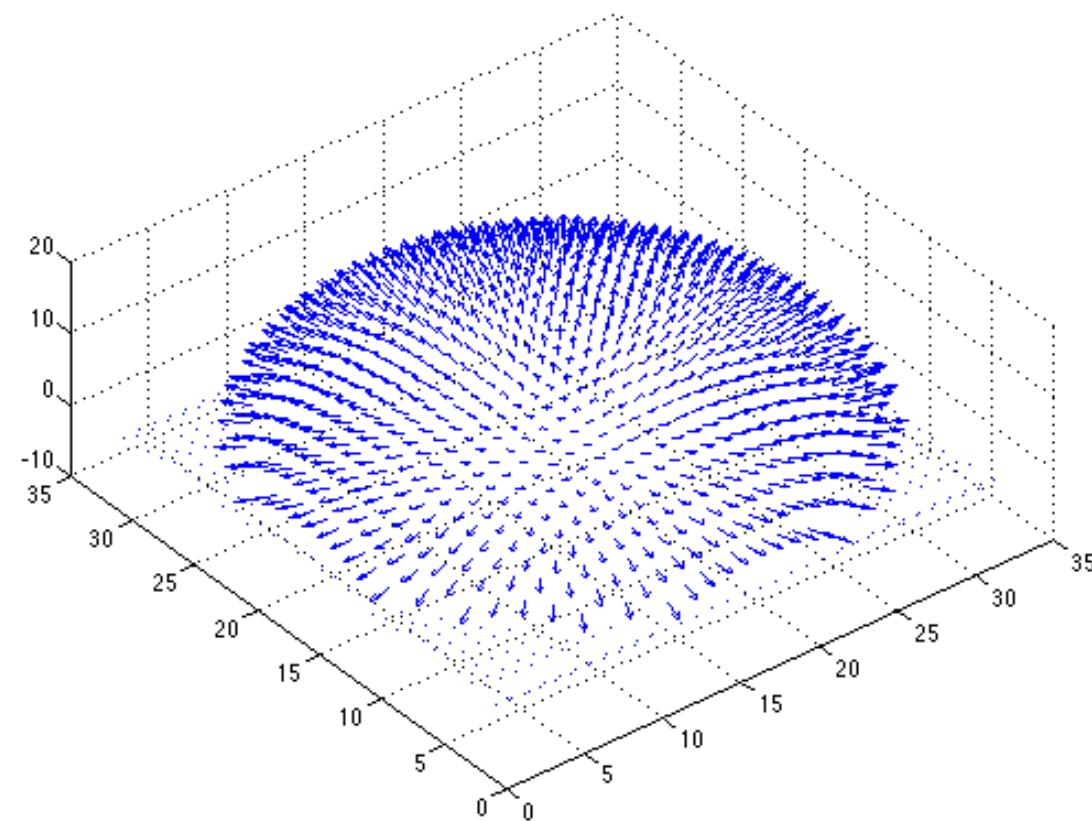
- five input images taken by changing only the light position



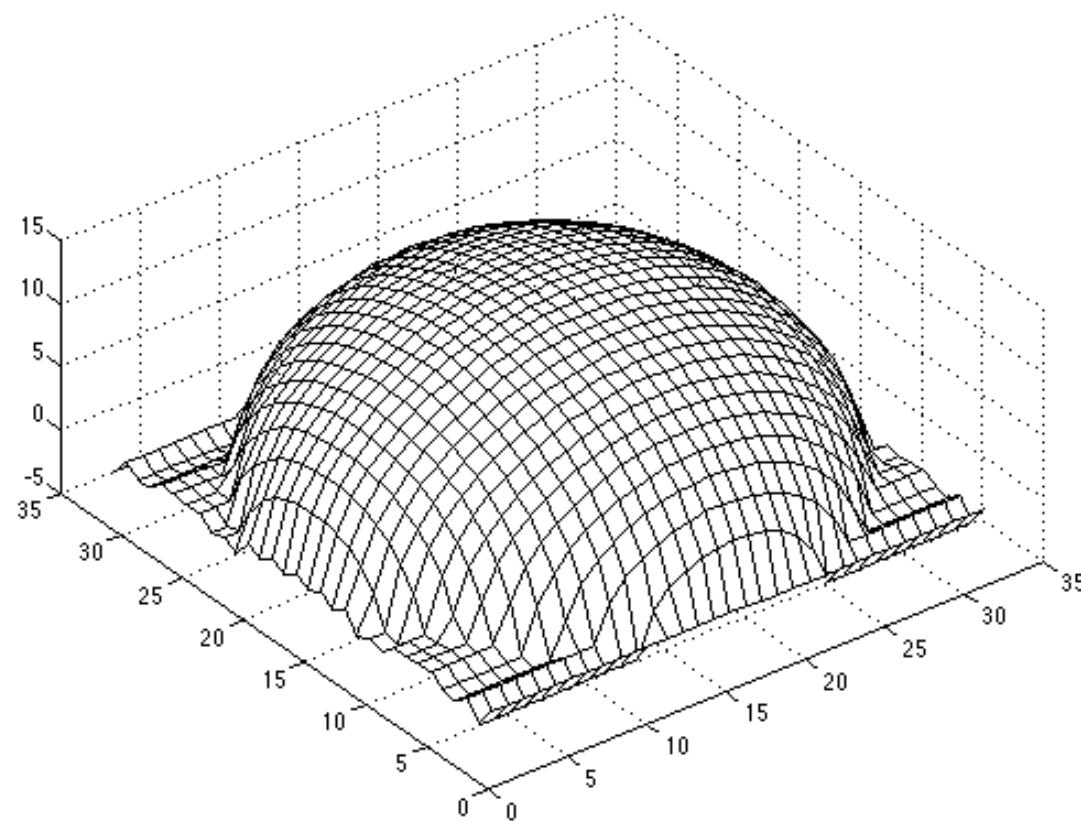
# Recovered reflectance



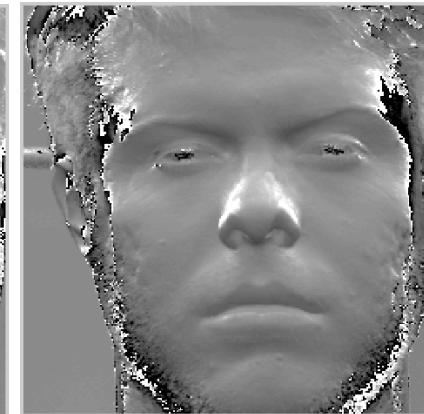
# Recovered normal field



# Surface recovered by integration



# Photometric stereo example



data from: <http://www1.cs.columbia.edu/~belhumeur/pub/images/yalefacesB/readme>