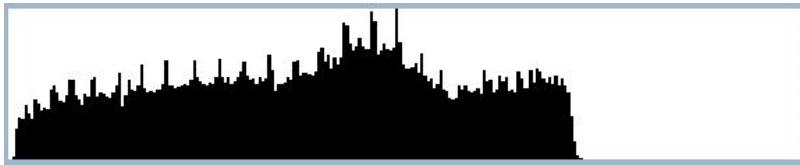


Photometric Processing

Histogram

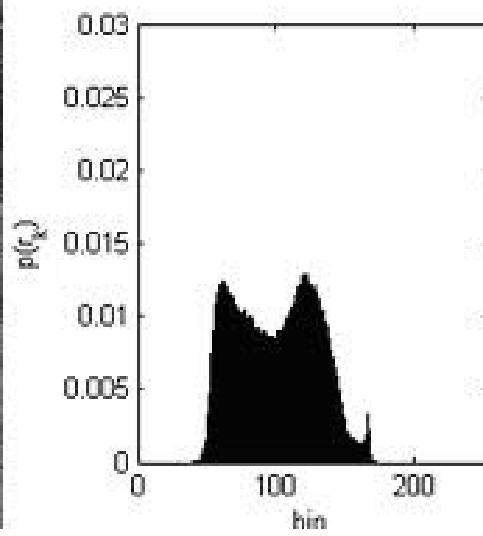
- Probability distribution of the different grays in an image

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



Contrast Enhancement

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

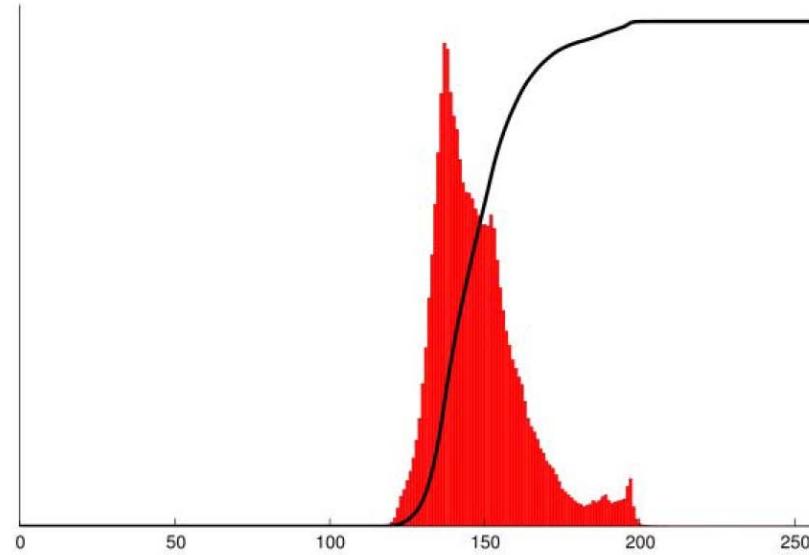


Histogram Stretching

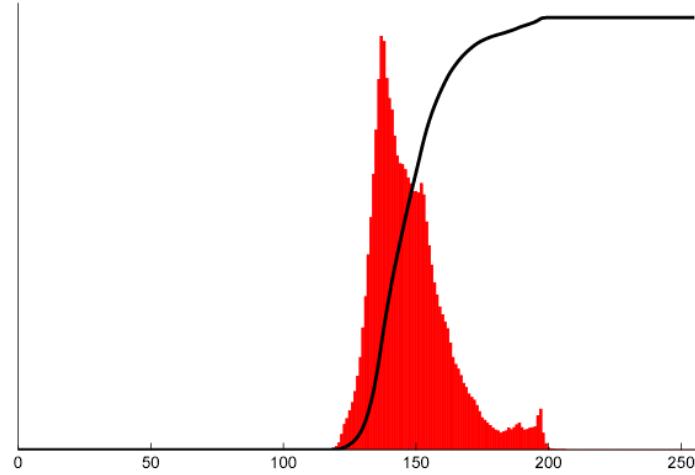
$$c(i) = \sum_{j=0}^i p(x_j)$$

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

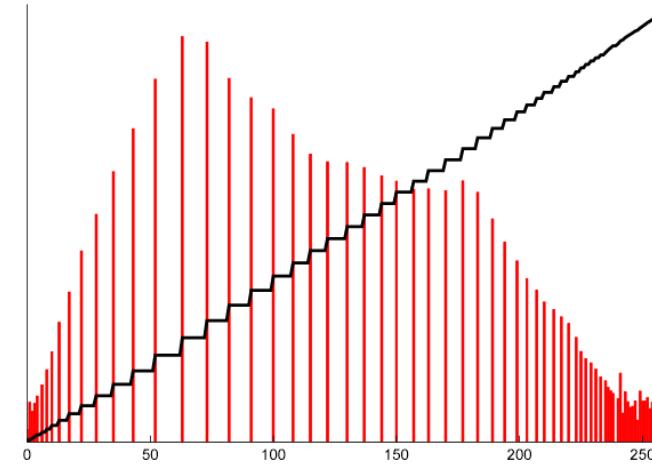
$$y_i = T(x_i) = c(i)$$



Results



Results

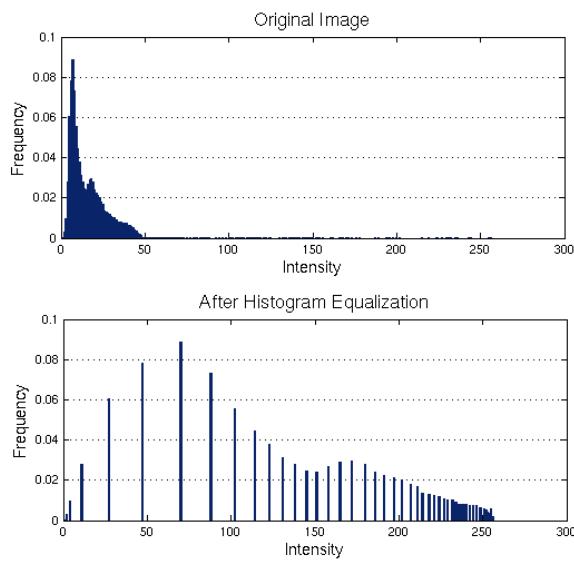
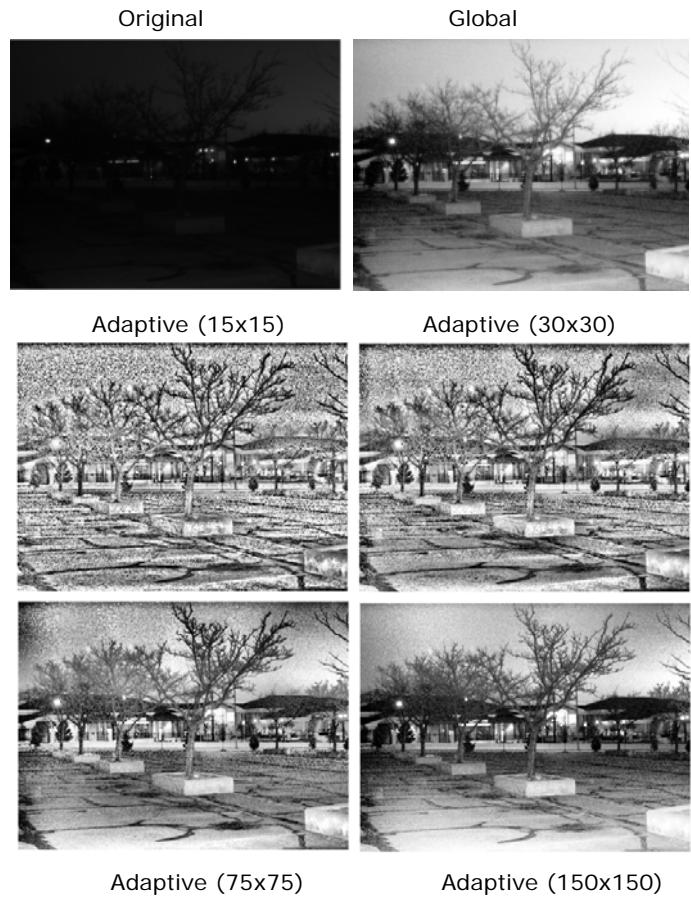


Burn out effects

Adaptive Histogram Stretching

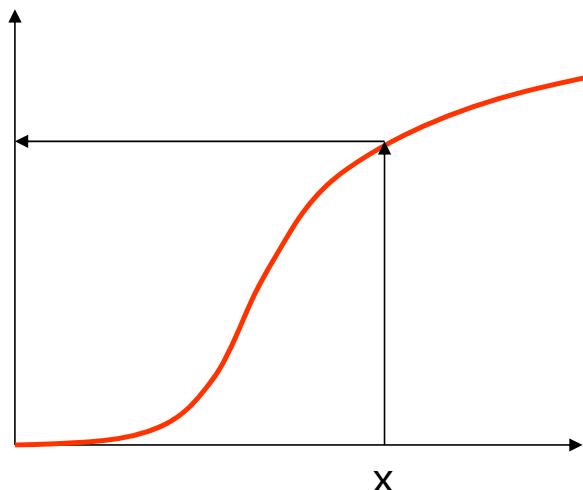
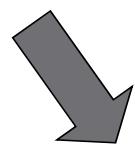
- Choose a neighborhood
- Apply histogram equalization to the pixels in that window
- Replace the center pixel with the histogram equalized value
- Do this for all pixels
- Compute intensive
- Leads to noise

Results

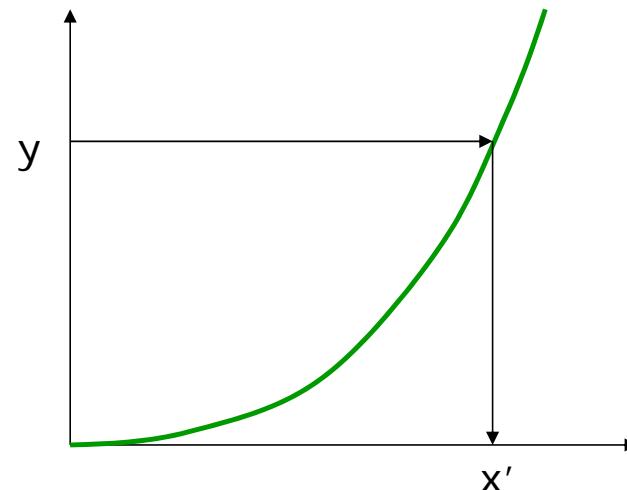
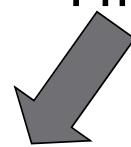


Histogram Matching

Histogram 1



Histogram 2



Appearance Transfer



Image Compositing



Mosaic Blending

Image Compositing



Compositing Procedure

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

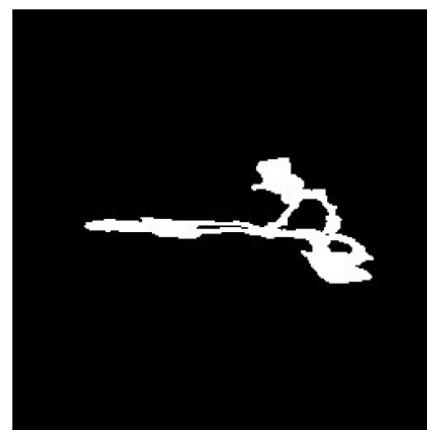
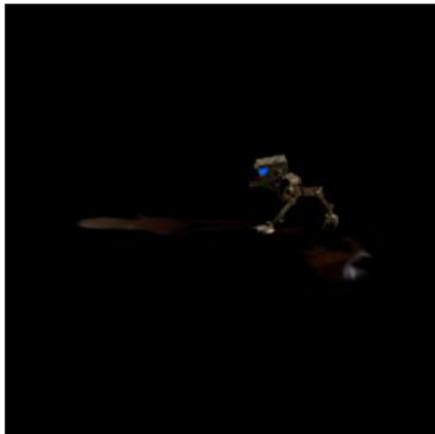


2. Blend them into the composite (in the right order)



Composite by
David Dewey

Replacing pixels rarely works

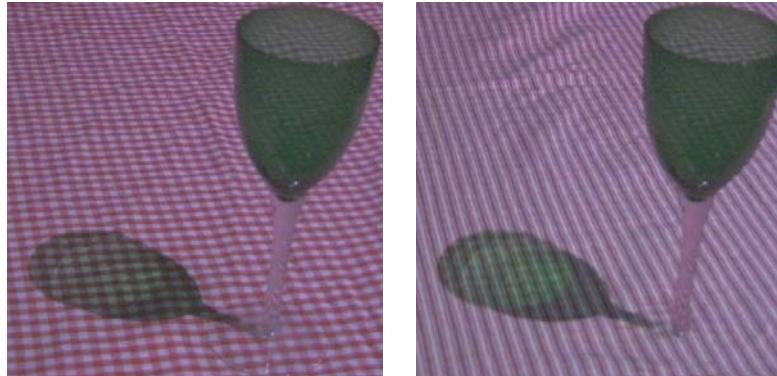


Binary
mask



Problems: boundaries & transparency (shadows)

Two Problems:



Semi-transparent objects

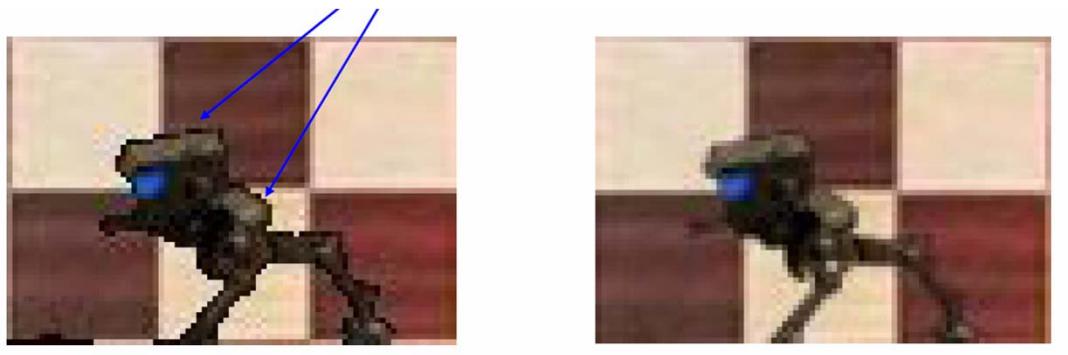


Pixels too large

Alpha Channel

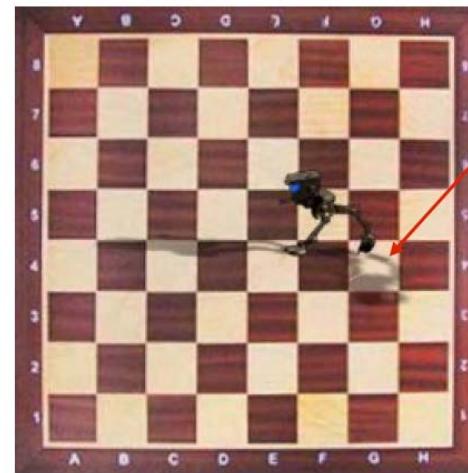
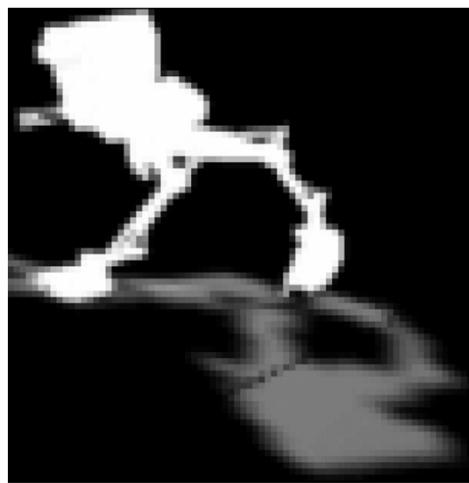
- Add one more channel:
 - `Image(R,G,B,alpha)`
- Encodes transparency (or pixel coverage):
 - Alpha = 1: opaque object (complete coverage)
 - Alpha = 0: transparent object (no coverage)
 - $0 < \text{Alpha} < 1$: semi-transparent (partial coverage)
- Example: $\text{alpha} = 0.3$

Alpha Blending



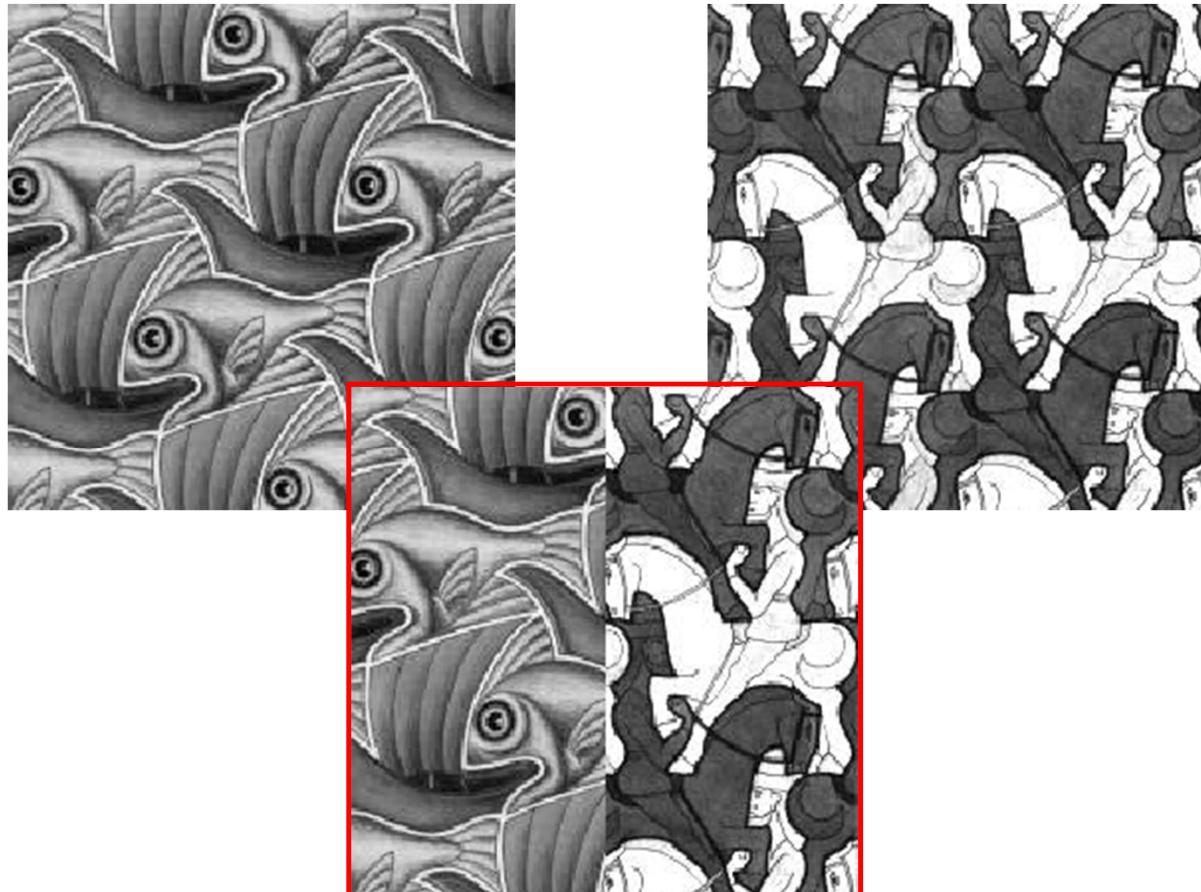
$$I_{\text{comp}} = \alpha I_{\text{fg}} + (1-\alpha) I_{\text{bg}}$$

alpha
mask



shadow

Alpha Hacking...

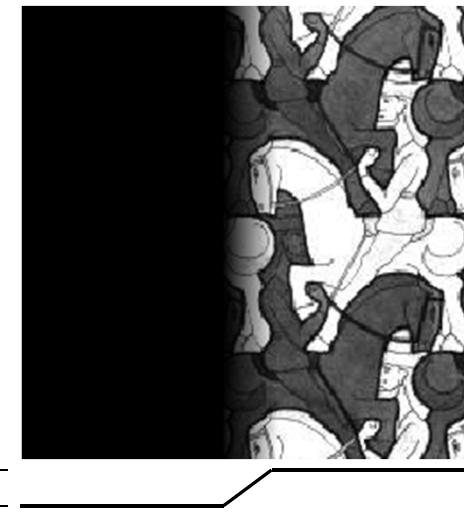


No physical interpretation, but it smoothes the seams

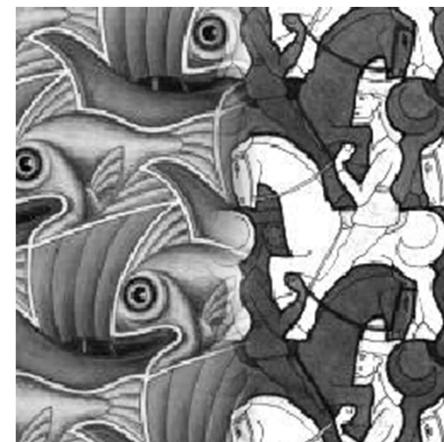
Feathering



+



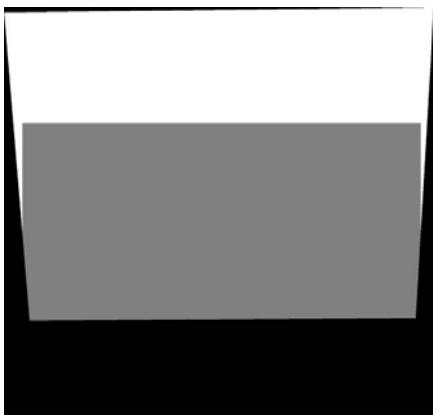
=



Encoding as transparency

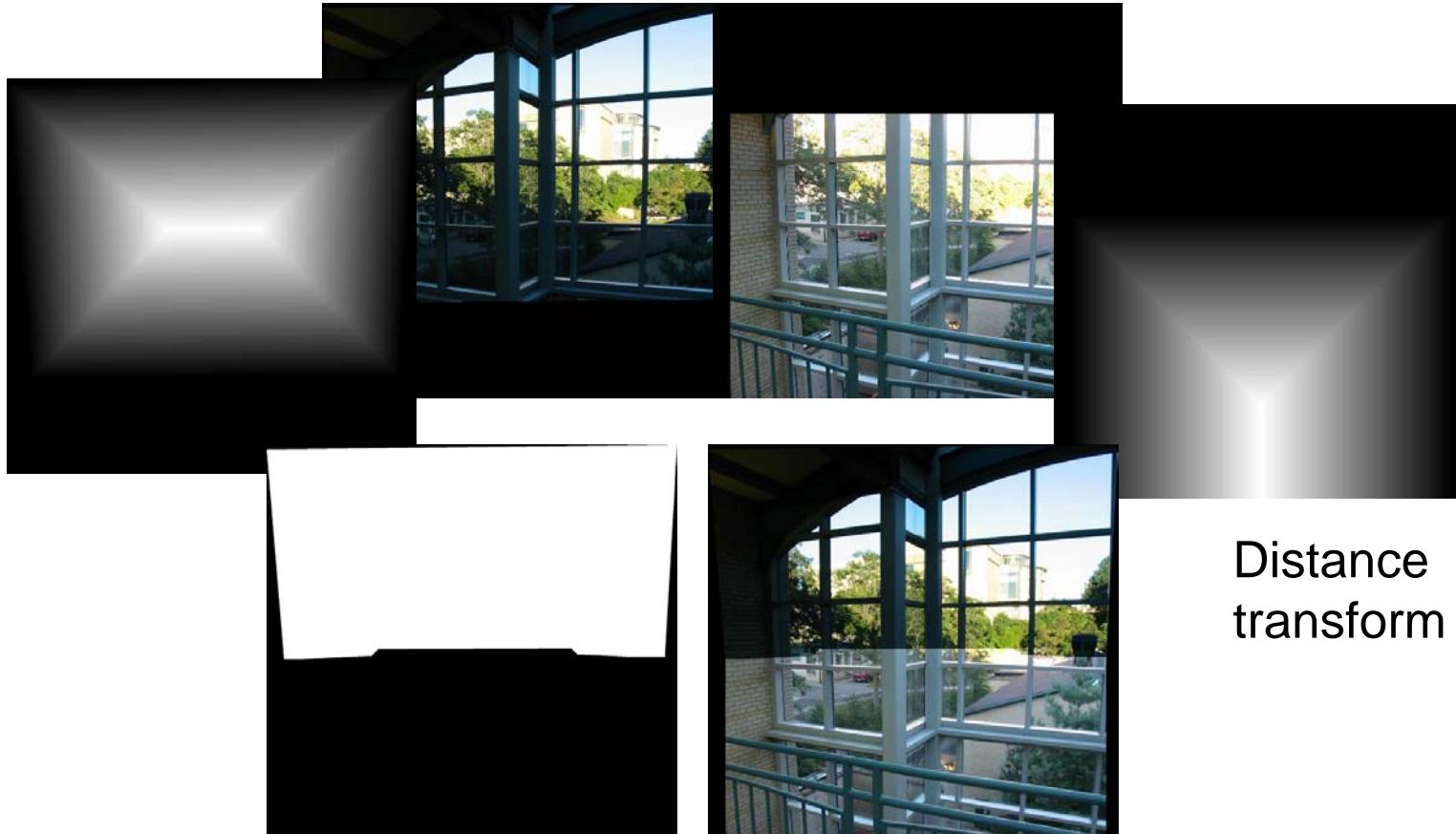
$$I_{\text{blend}} = \alpha I_{\text{left}} + (1-\alpha) I_{\text{right}}$$

Setting alpha: simple average



Alpha = .5 in overlap region

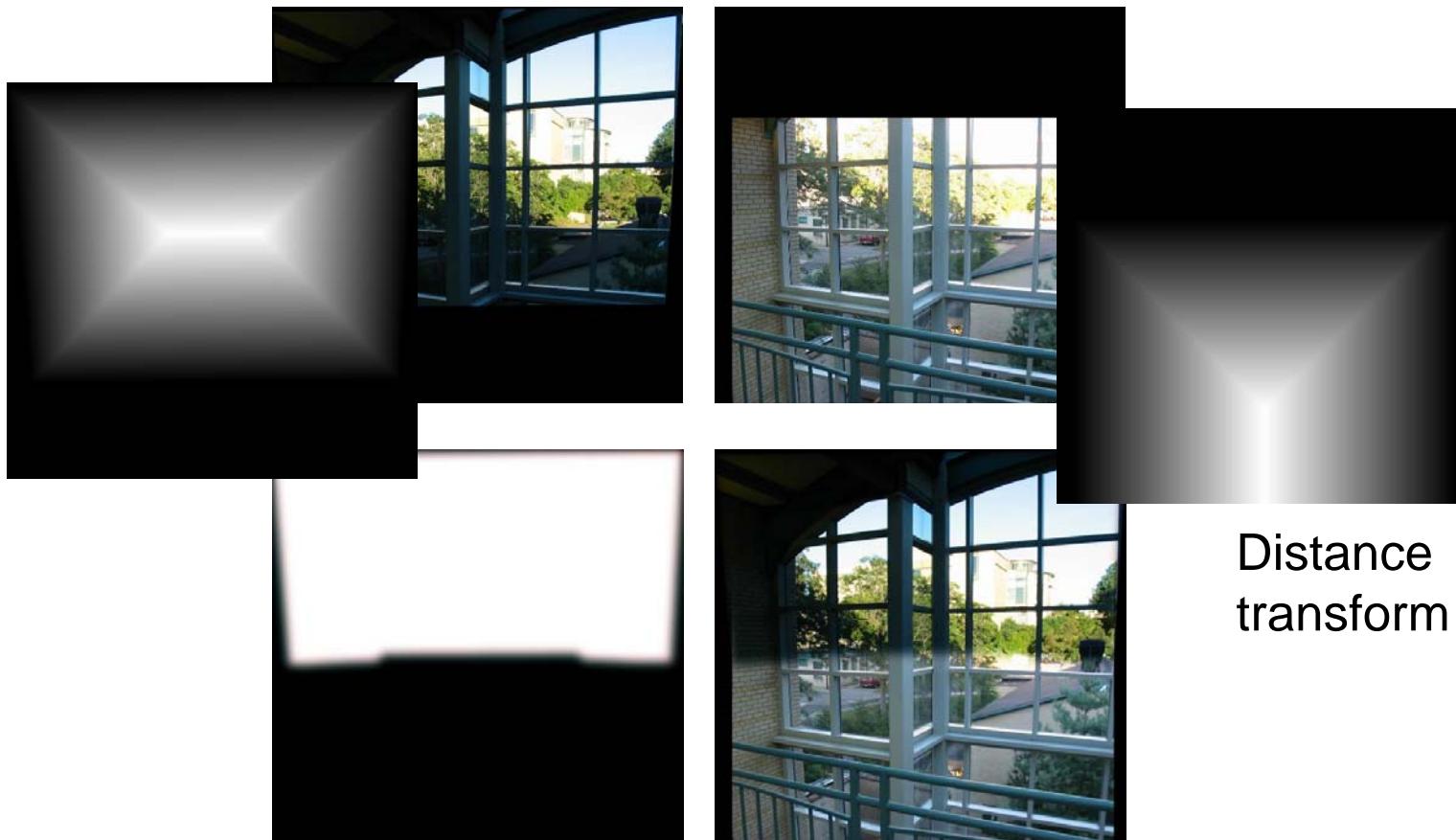
Setting alpha: center seam



Distance
transform

Alpha = logical(dtrans1>dtrans2)

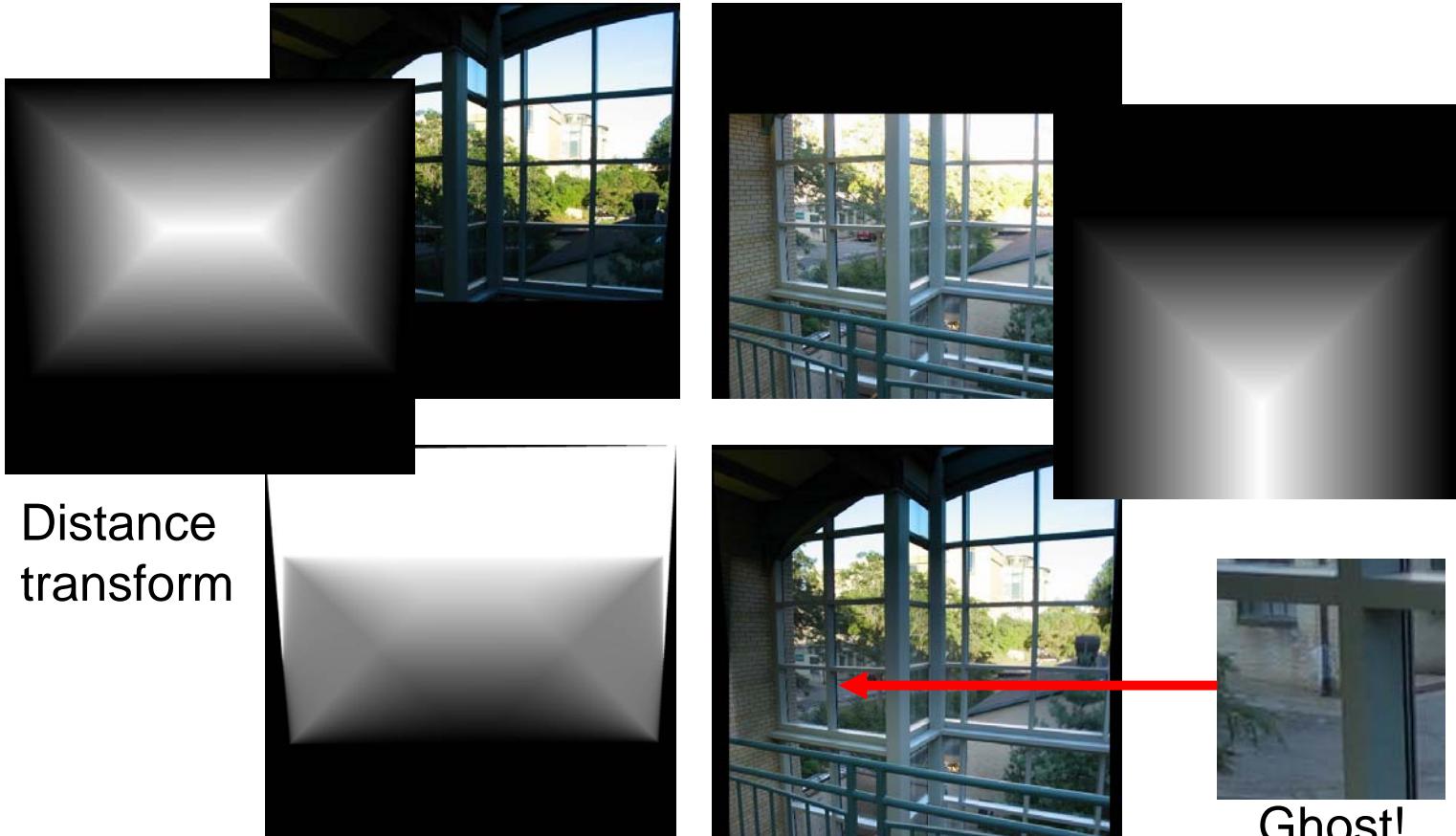
Setting alpha: blurred seam



Alpha = blurred

Distance
transform

Setting alpha: center weighting

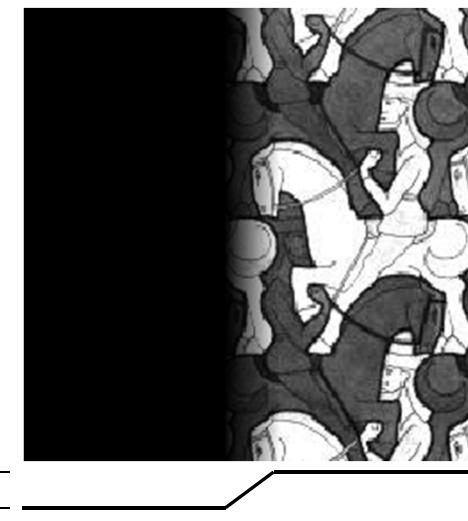


$$\text{Alpha} = \text{dtrans1} / (\text{dtrans1} + \text{dtrans2})$$

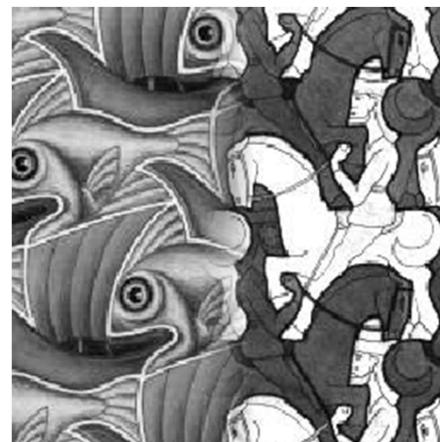
Feathering



+



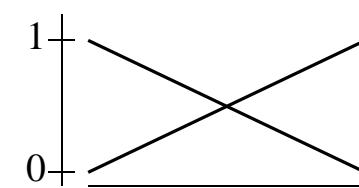
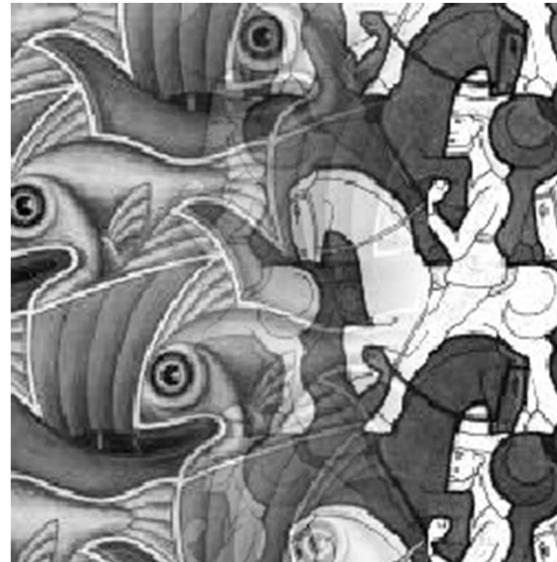
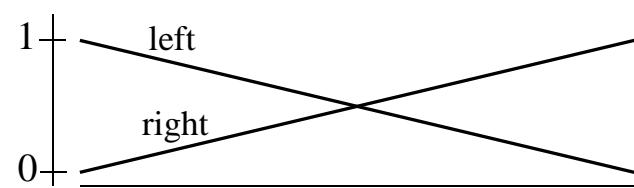
=



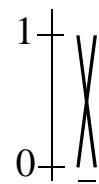
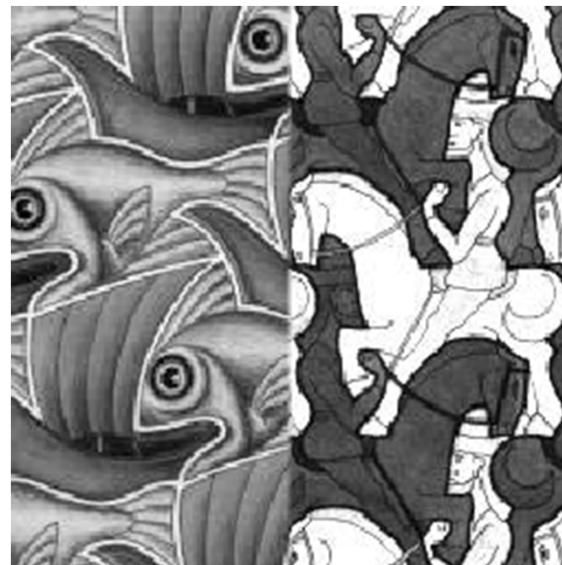
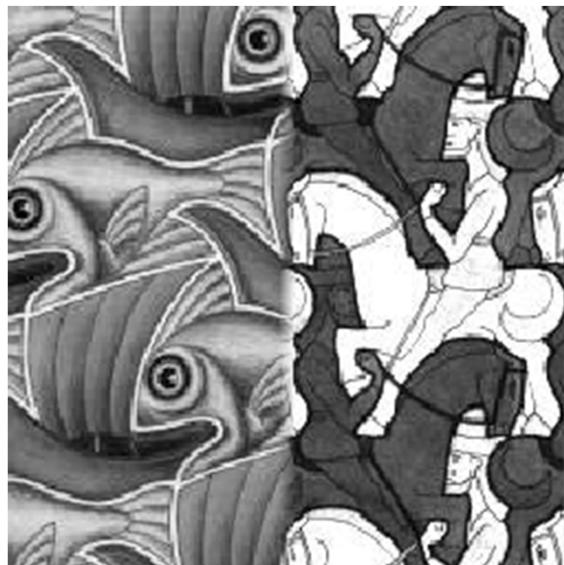
Encoding as transparency

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

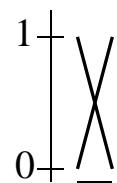
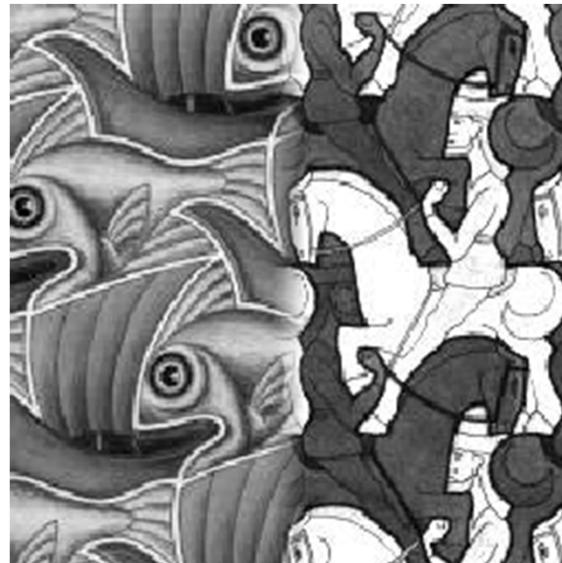
Affect of Window Size



Affect of Window Size

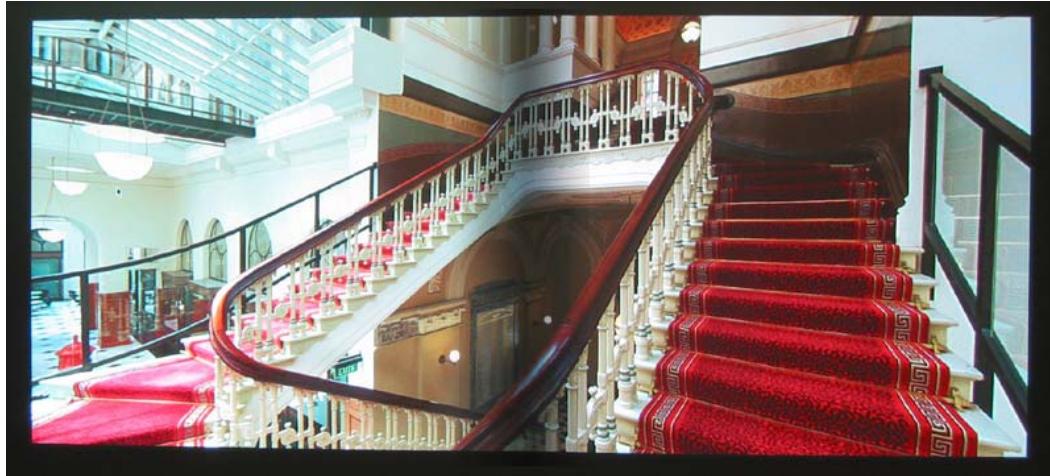


Good Window Size



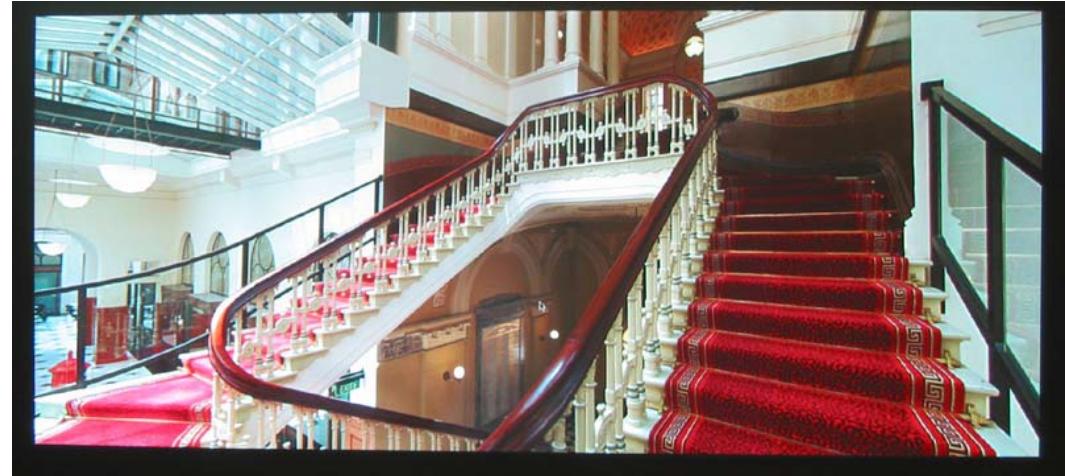
“Optimal” Window: smooth but not ghosted

Type of Blending function



Linear
(Only function continuity)

Spline or Cosine
(Gradient continuity also)

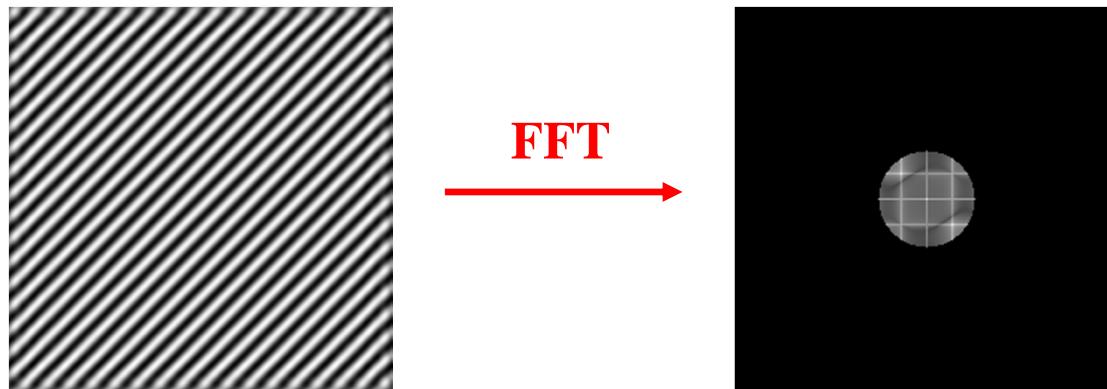


What is the Optimal Window?

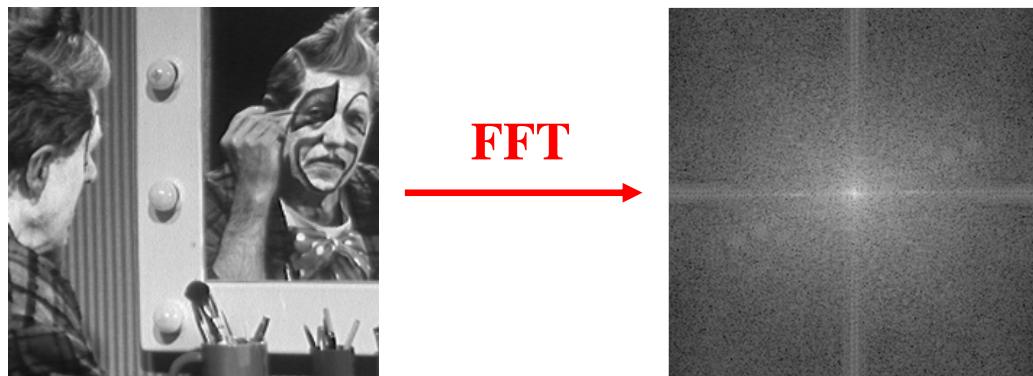
- To avoid seams
 - window = size of largest prominent feature
- To avoid ghosting
 - window $\leq 2 \times$ size of smallest prominent feature

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)



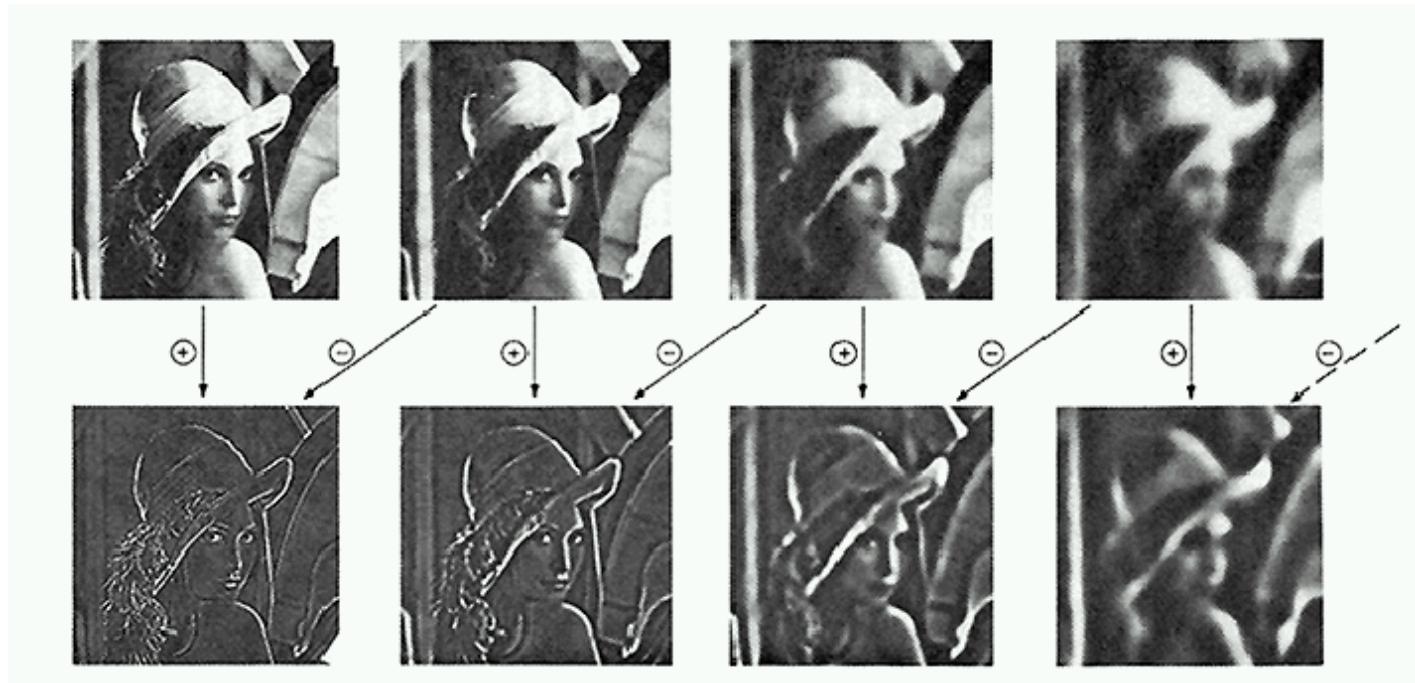
Frequency Spread is Wide



- 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

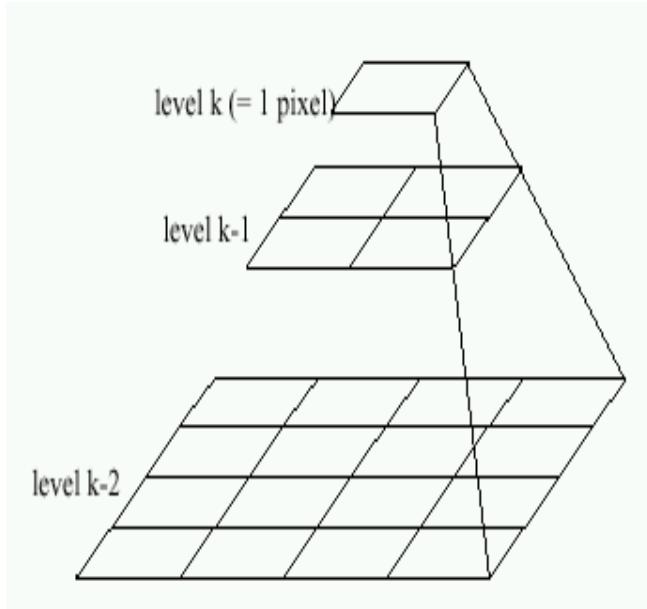
Octaves in the Spatial Domain

Lowpass Images

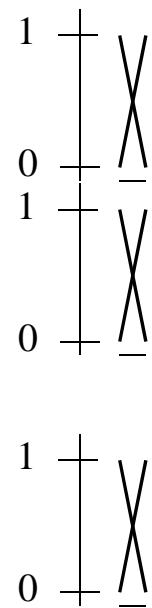


- Bandpass Images

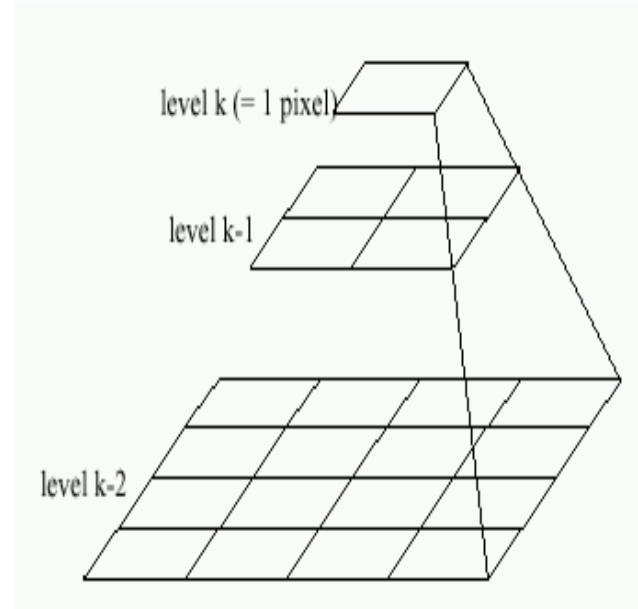
Pyramid Blending



Left pyramid

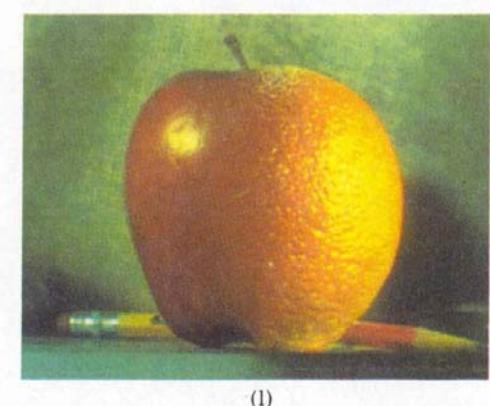
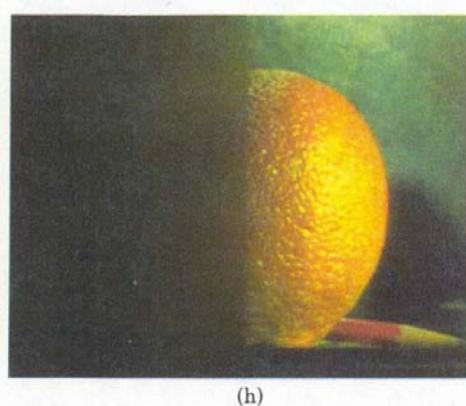
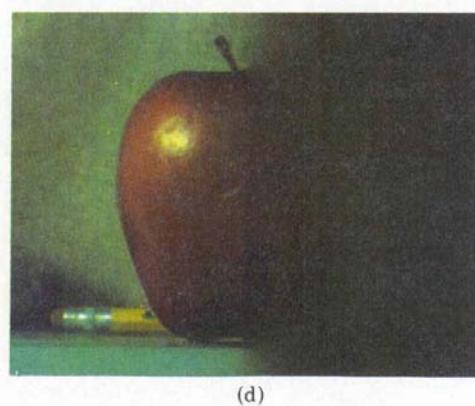
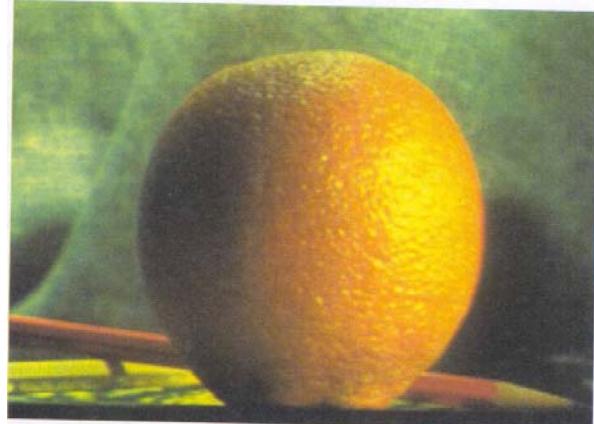
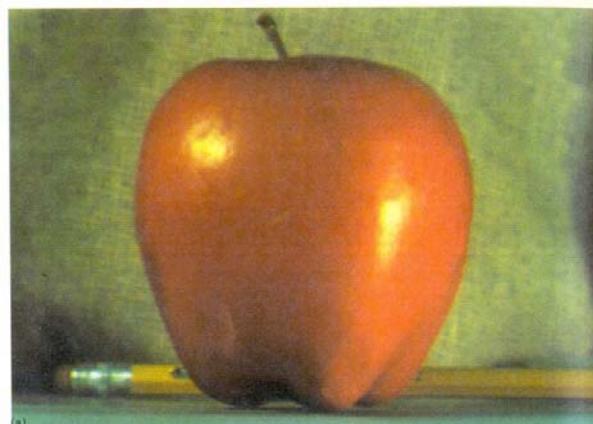


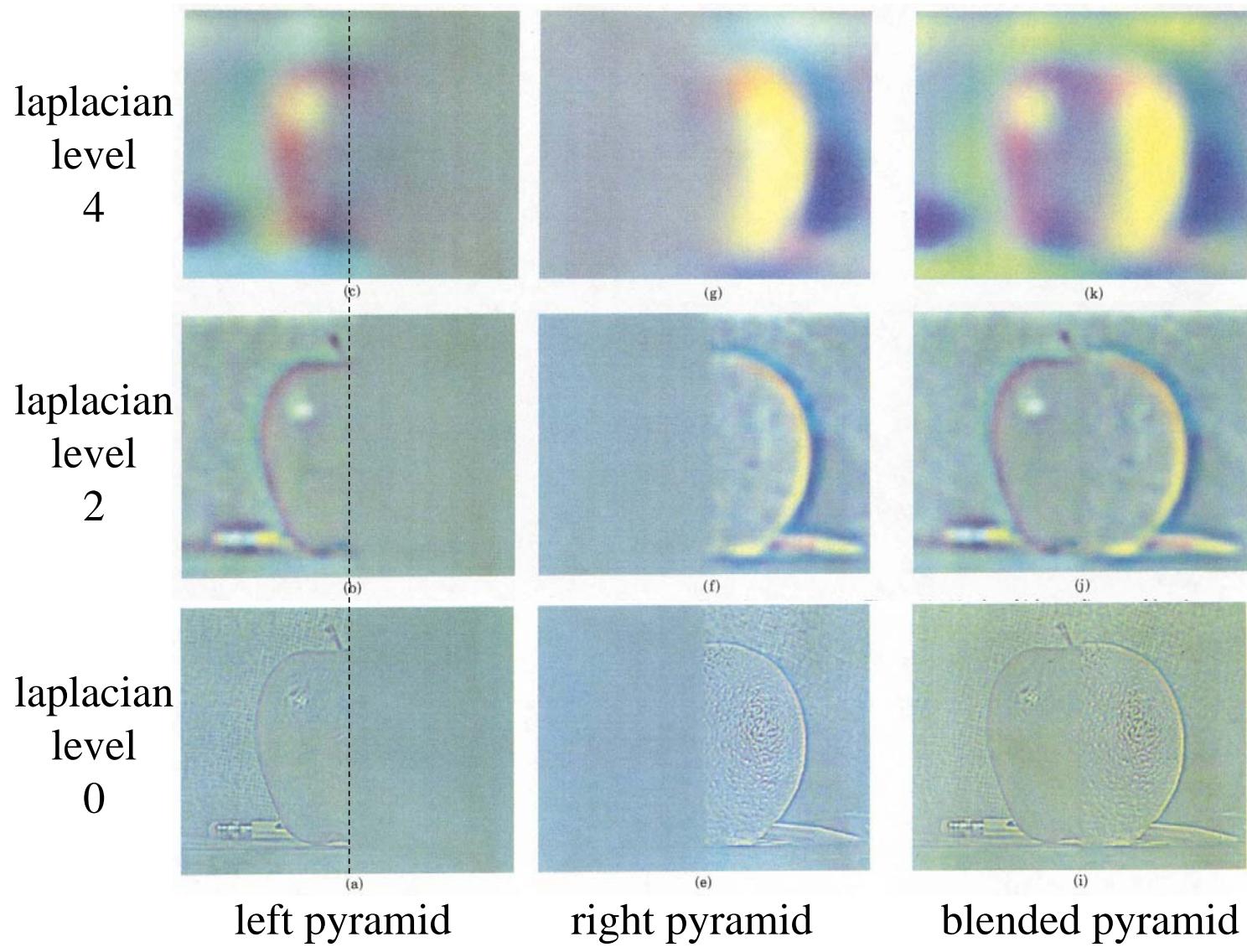
blend



Right pyramid

Pyramid Blending





Laplacian Pyramid: Blending

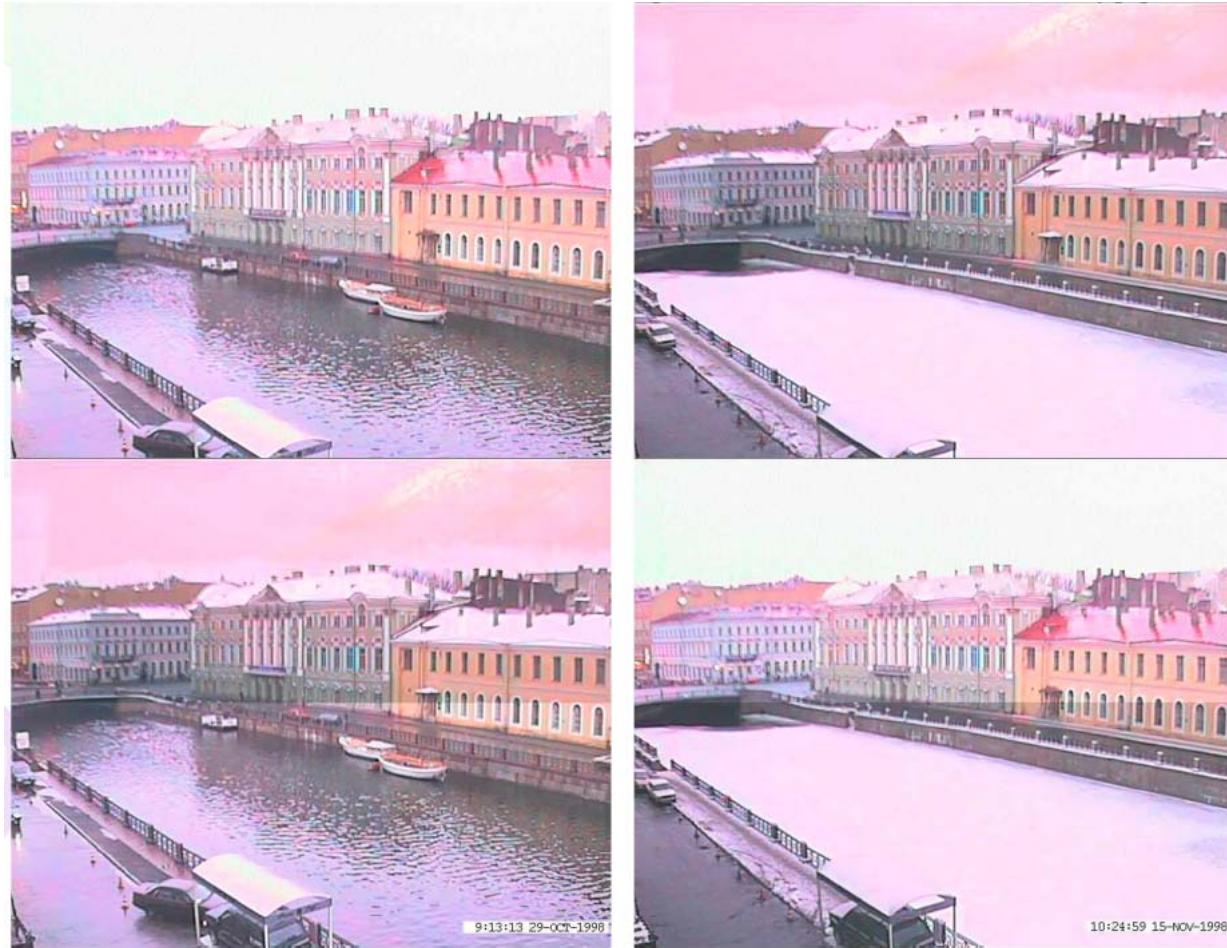
- General Approach:
 1. Build Laplacian pyramids LA and LB from images A and B
 2. Build a Gaussian pyramid GR from selected region R
 3. Form a combined pyramid LS from LA and LB using nodes of GR as weights:
 - $LS(i,j) = GR(i,j) * LA(I,j) + (1 - GR(i,j)) * LB(I,j)$
 4. Collapse the LS pyramid to get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

Blending Regions



↓

Season Blending



Simplify: 2 band blending

- Brown & Lowe, 2003
 - Only use two bands: high and low freq.
 - Blends low freq. smoothly
 - Blend high freq. with no smoothing: use binary alpha



Simplify: 2 band blending



Low frequency ($\lambda > 2$ pixels)



High frequency ($\lambda < 2$ pixels)

Linear Blending



2-band Blending



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

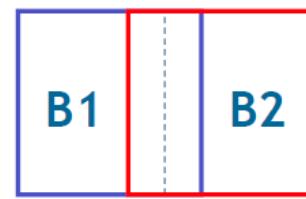
- Segment into regions
 - Single source per region
 - Avoid artifacts along the boundary
 - Dijkstra's shortest path method



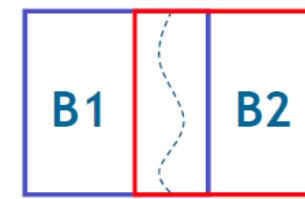
Eros and Freeman 2001



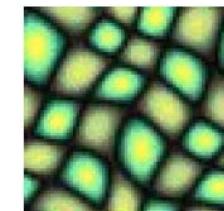
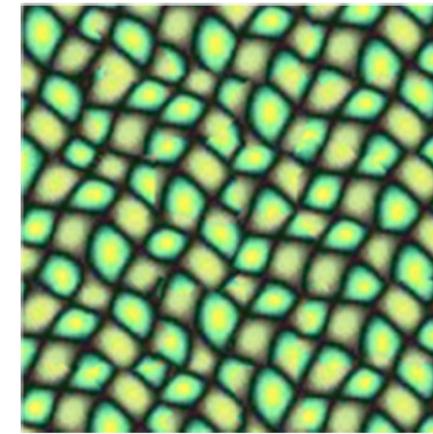
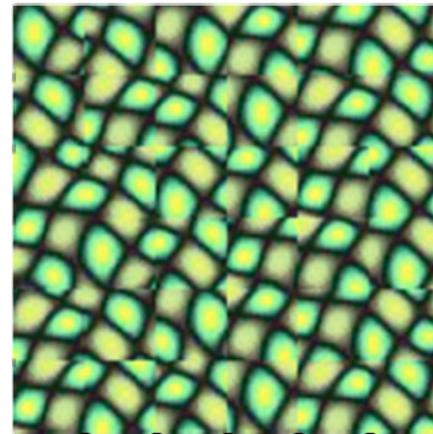
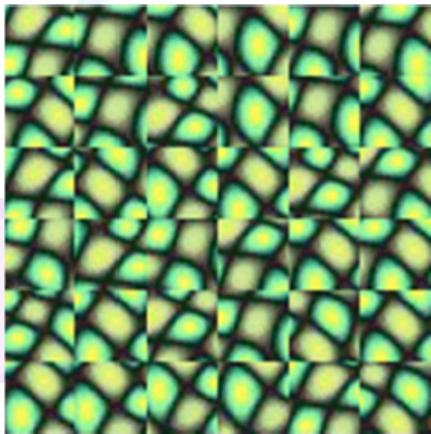
Random placement
of blocks



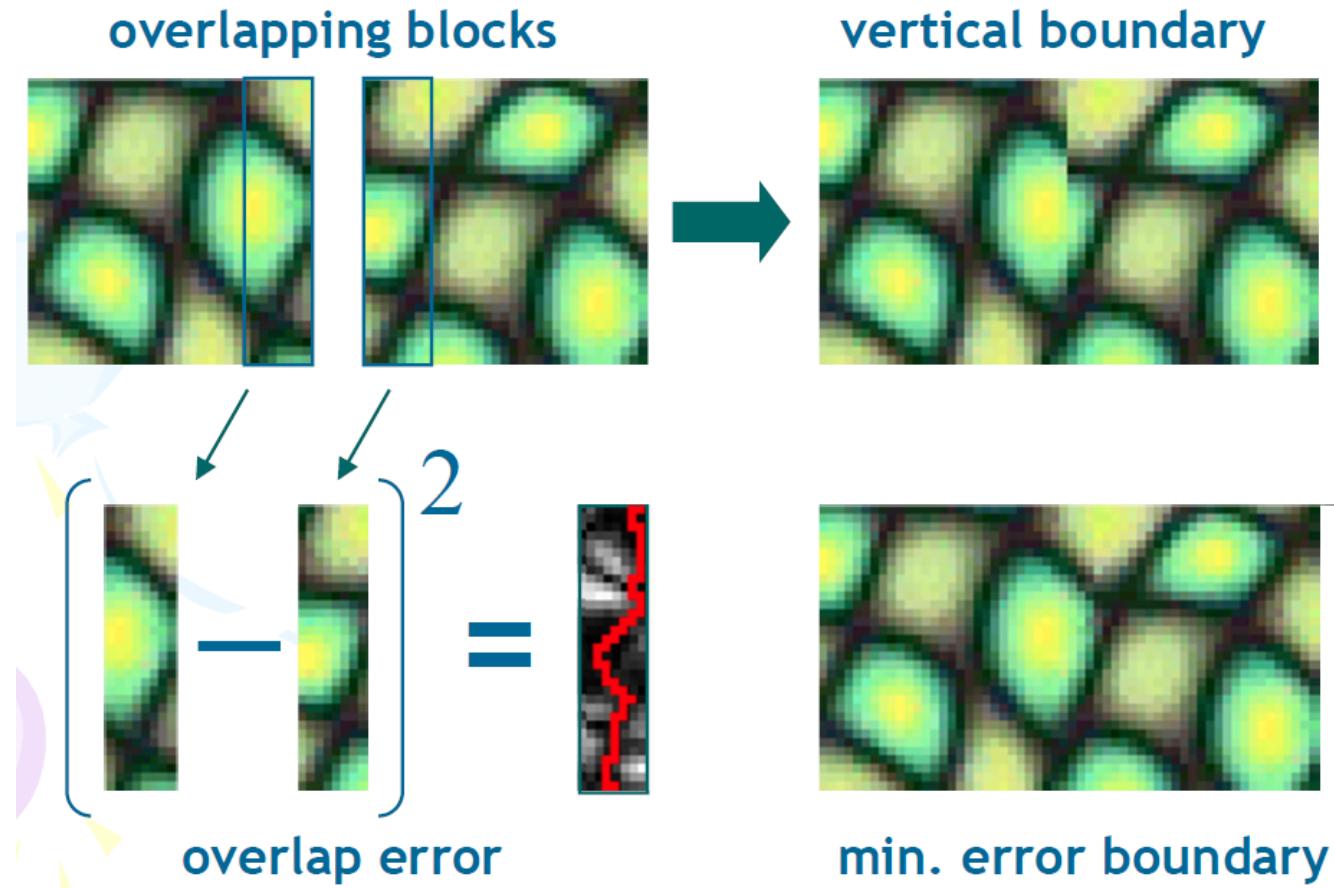
Neighboring blocks
constrained by overlap



Minimal error
boundary cut



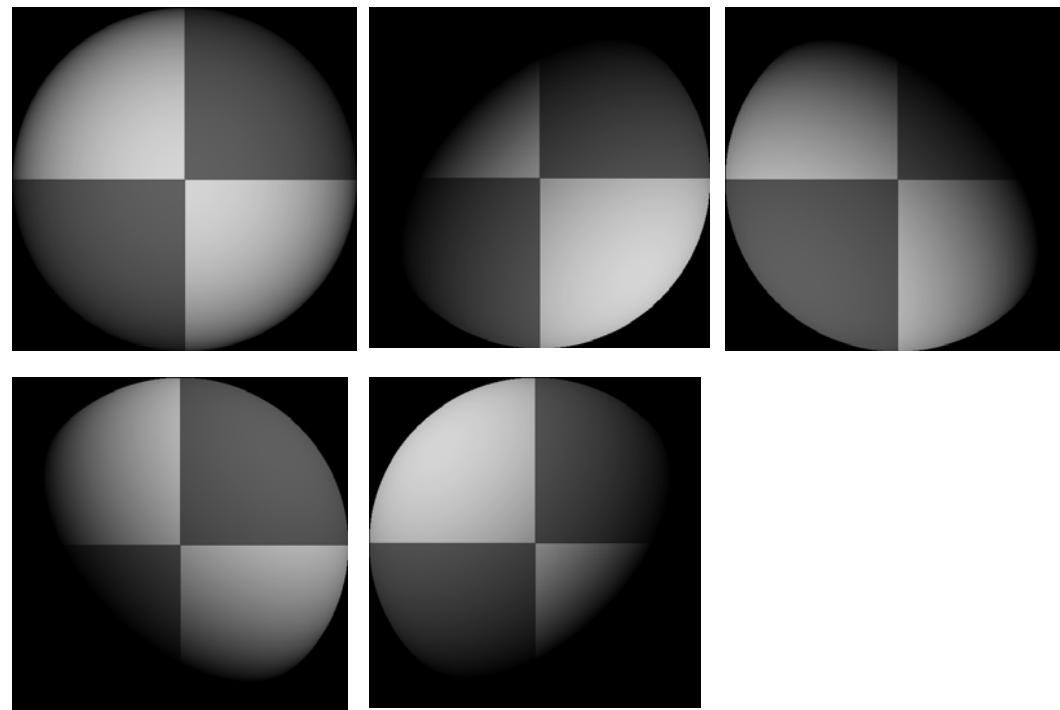
Minimum Error Boundary



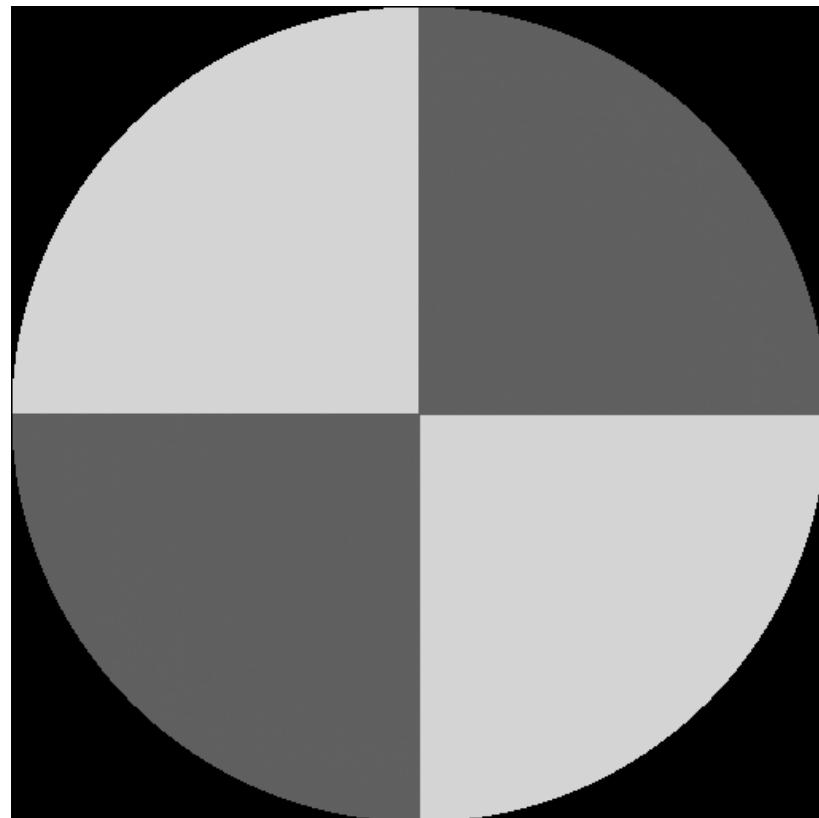
Photometric Stereo

Example figures

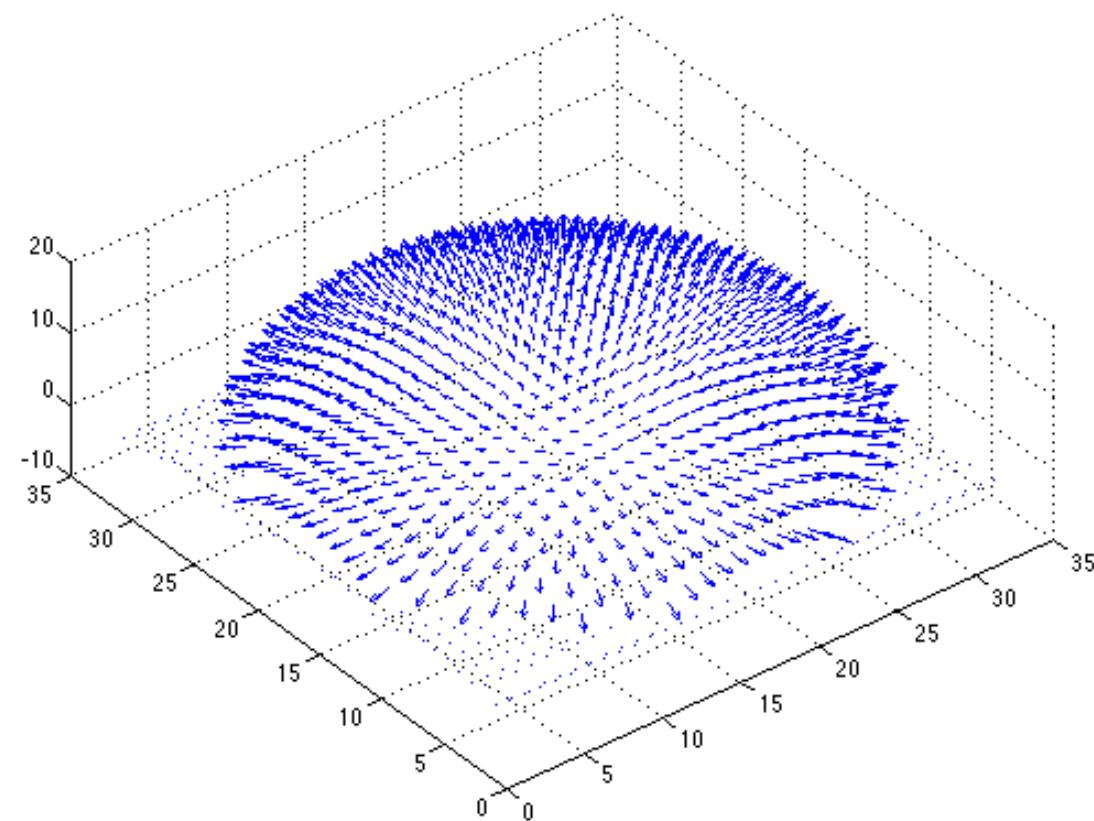
- five input images taken by changing only the light position



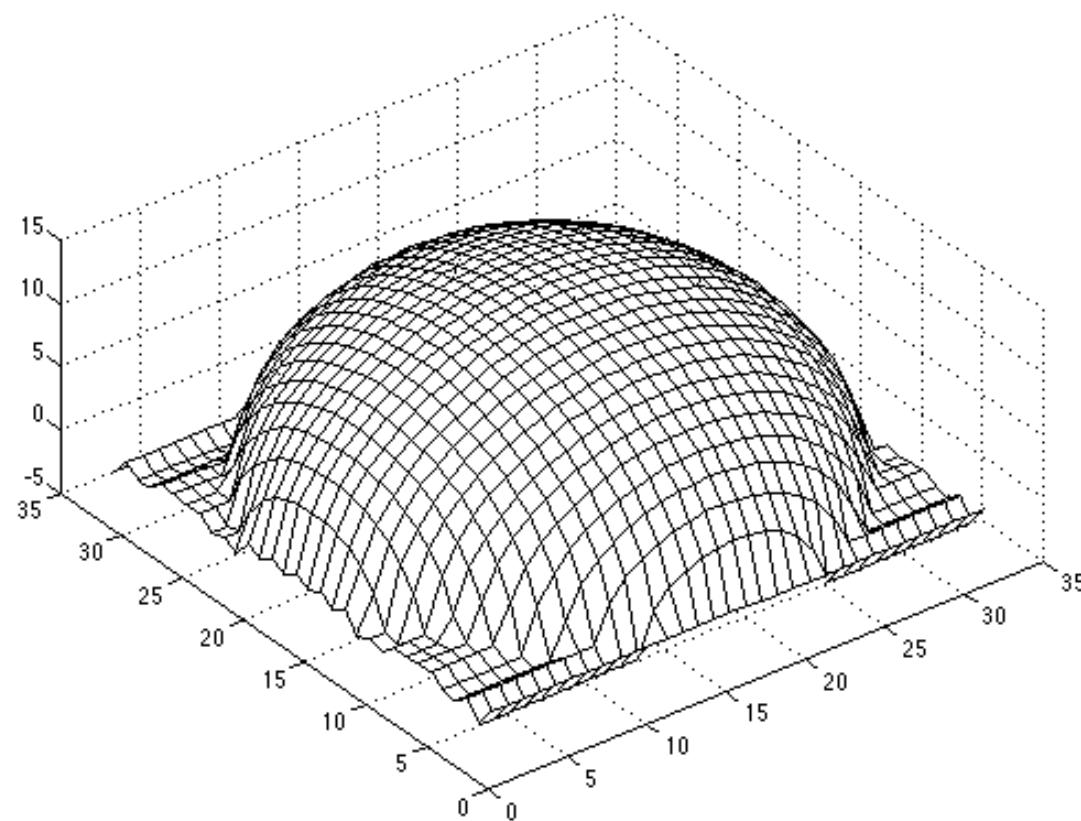
Recovered reflectance



Recovered normal field



Surface recovered by integration



Photometric stereo example

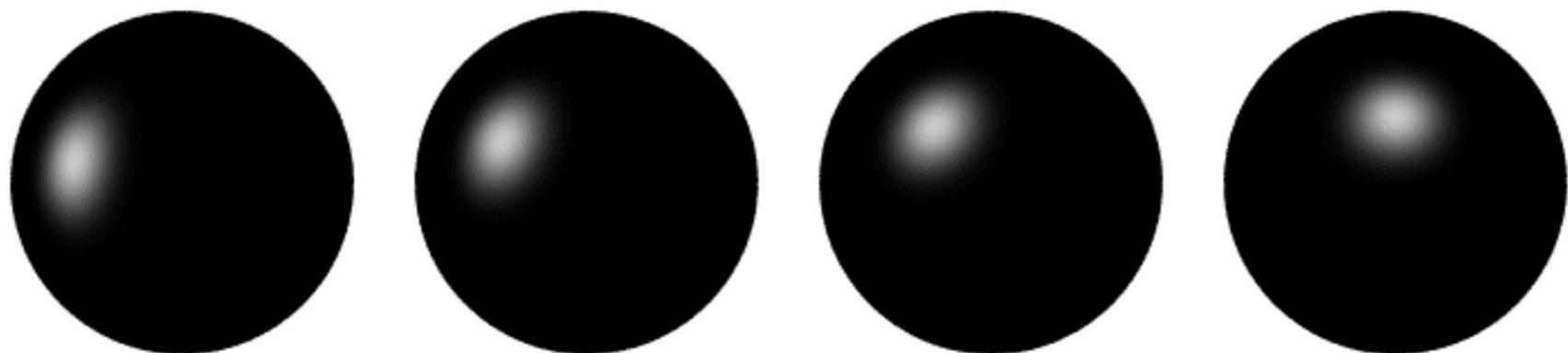


data from: <http://www1.cs.columbia.edu/~belhumeur/pub/images/yalefacesB/readme>

Presence of Shadows



Computing Illumination Directions



Computing Illumination Directions

$$L_i + V = 2(N \cdot V)N$$

