

Image Blending



© NASA

15-463: Computational Photography
Alexei Efros, CMU, Fall 2008

Image Compositing



Compositing Procedure

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

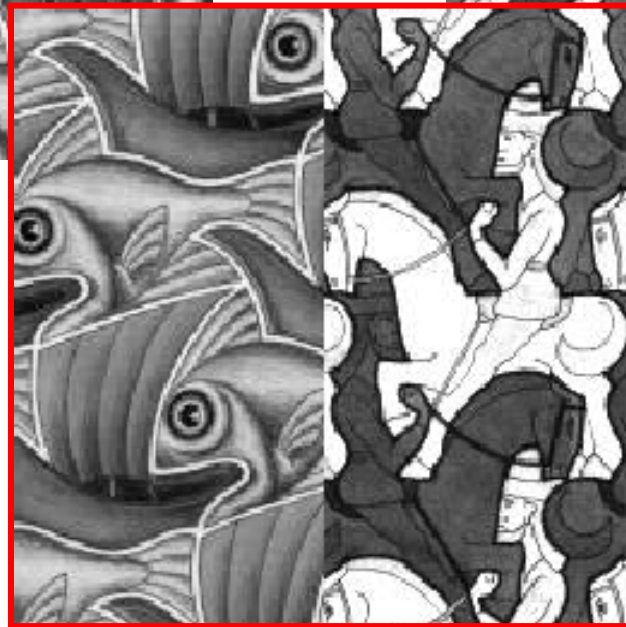
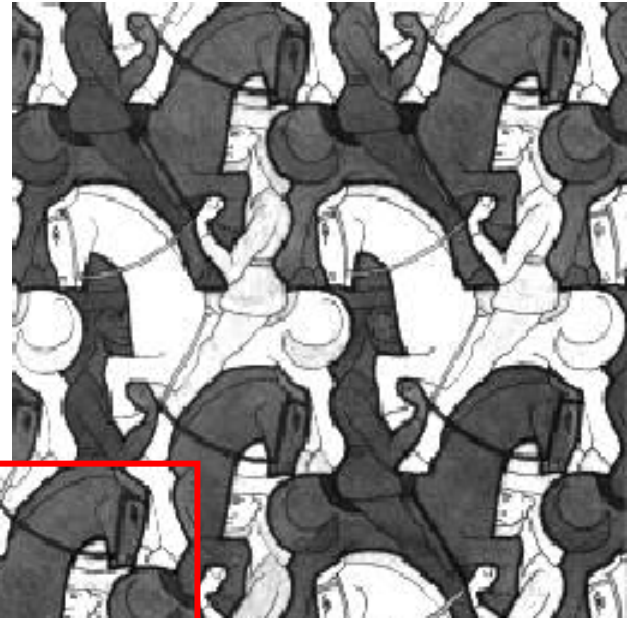
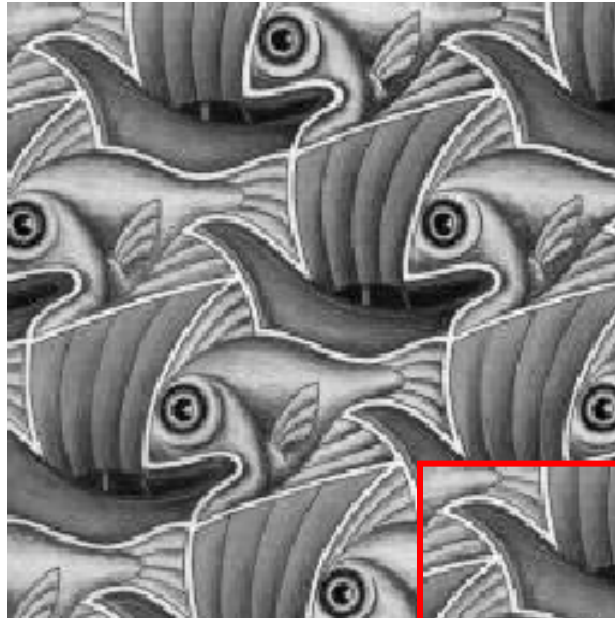


2. Blend them into the composite (in the right order)

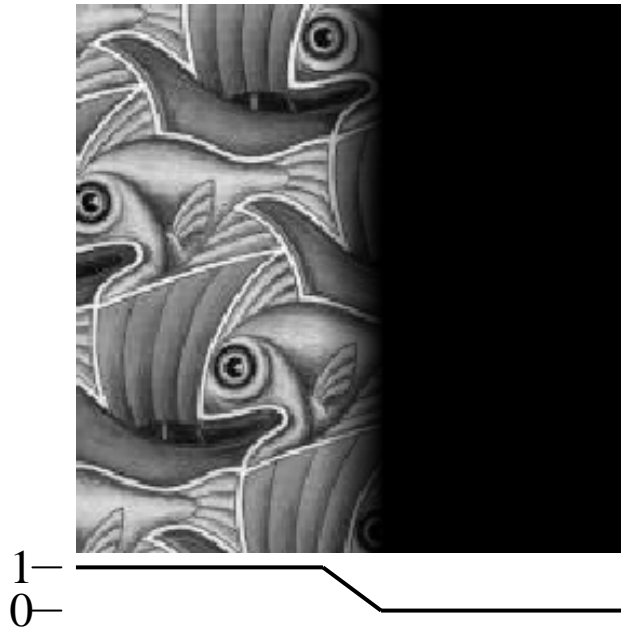


Composite by
David Dewey

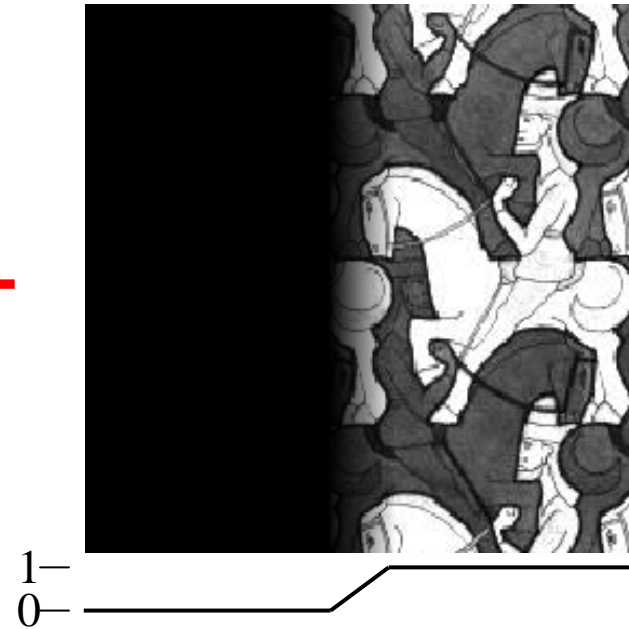
Need blending



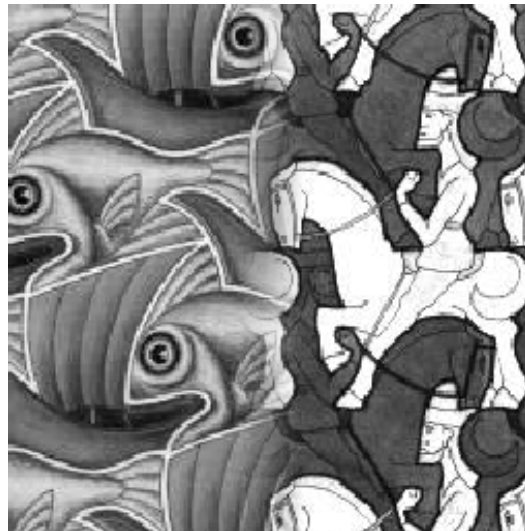
Alpha Blending / Feathering



+

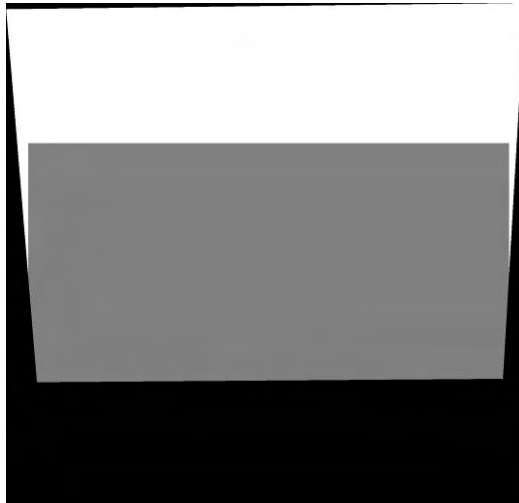


=



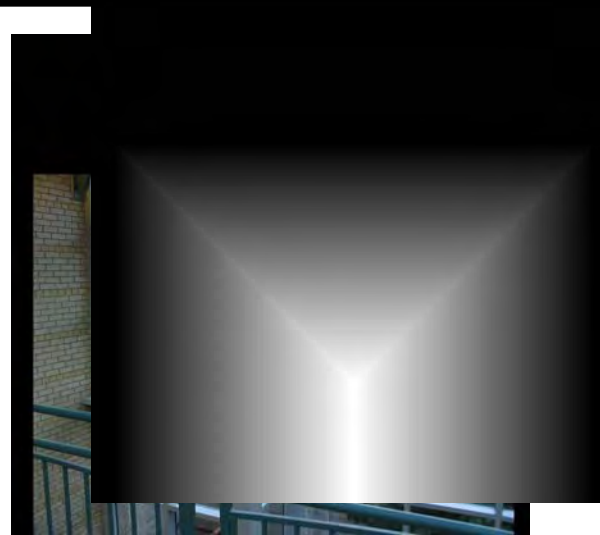
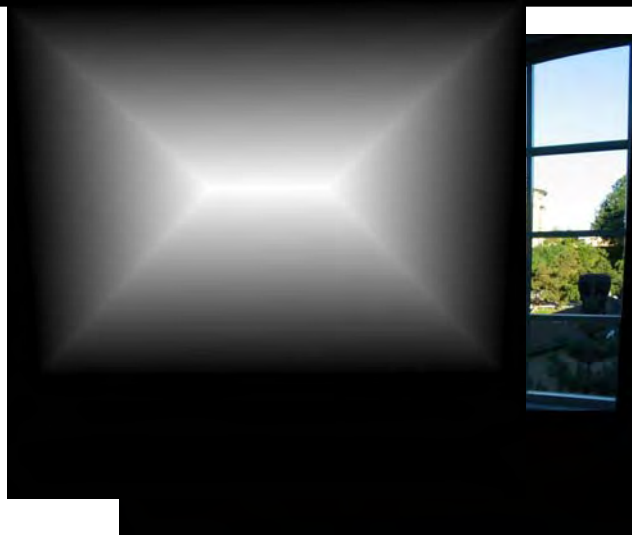
$$I_{\text{blend}} = \alpha I_{\text{left}} + (1-\alpha) I_{\text{right}}$$

Setting alpha: simple averaging

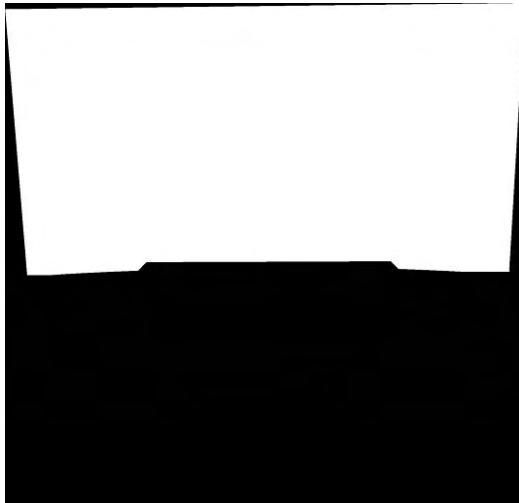


Alpha = .5 in overlap region

Setting alpha: center seam

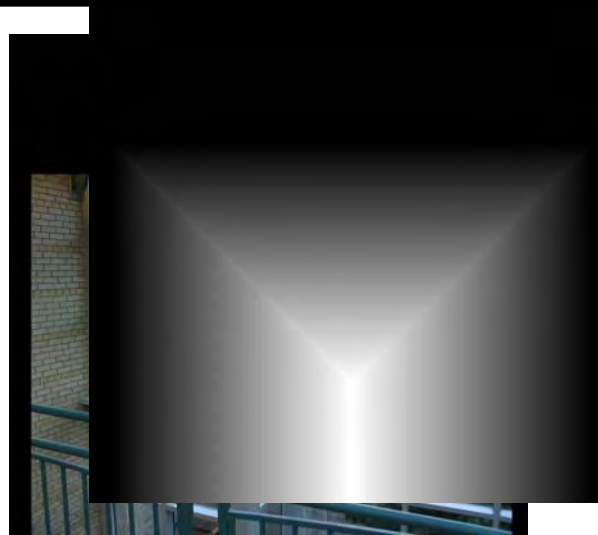


Distance
Transform
`bwdist`



$$\text{Alpha} = \text{logical}(\text{dtrans1} > \text{dtrans2})$$

Setting alpha: blurred seam

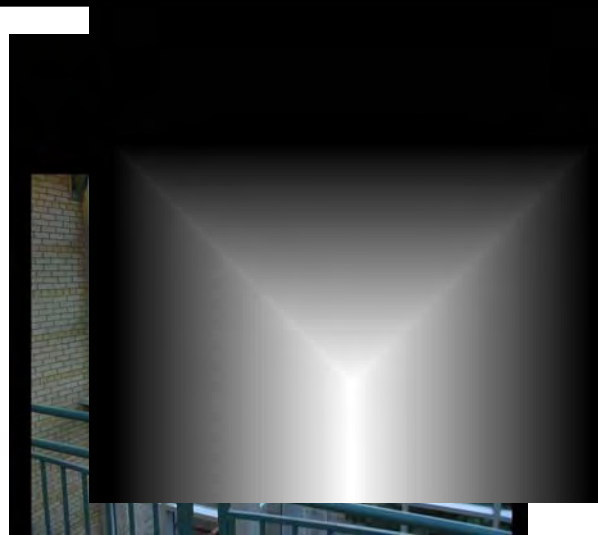


Distance
transform

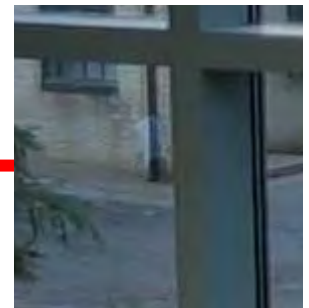
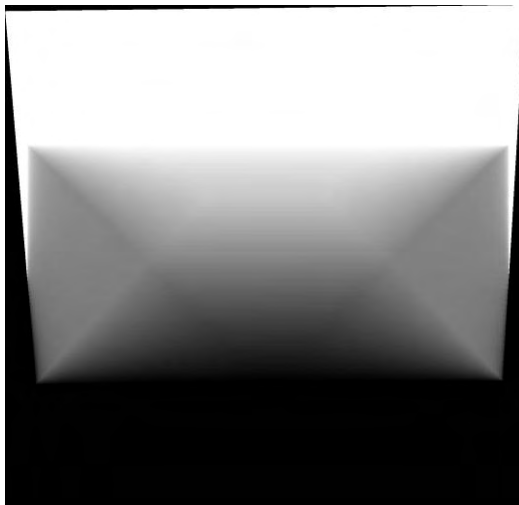


Alpha = blurred

Setting alpha: center weighting



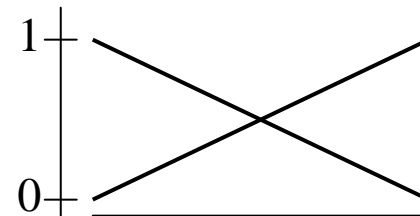
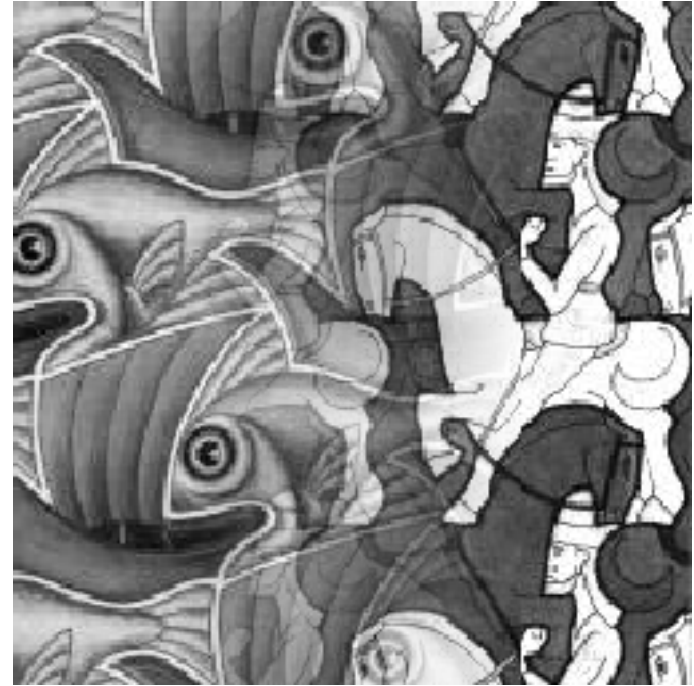
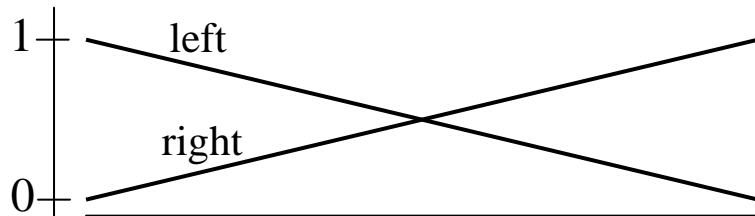
Distance
transform



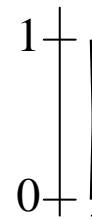
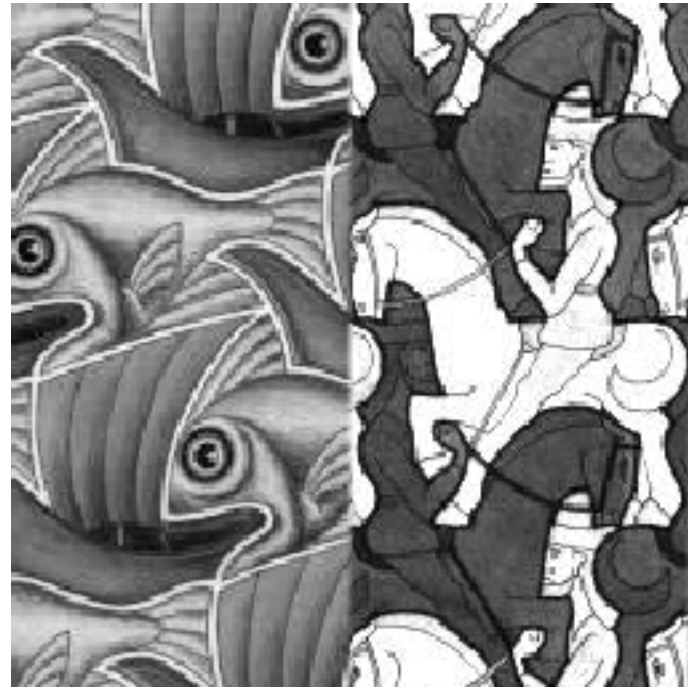
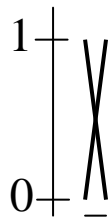
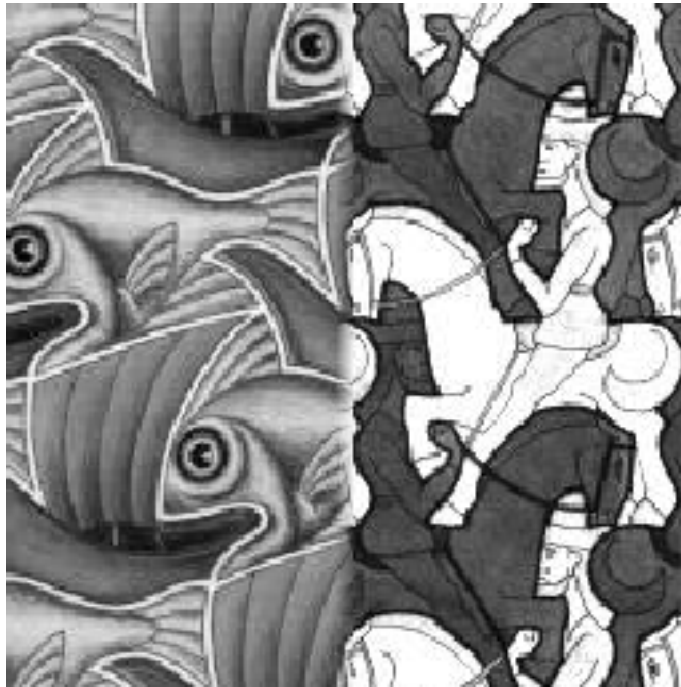
Ghost!

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

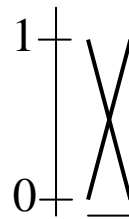
Affect of Window Size



Affect of Window Size



Good Window Size



“Optimal” Window: smooth but not ghosted

What is the Optimal Window?

To avoid seams

- window = size of largest prominent feature

To avoid ghosting

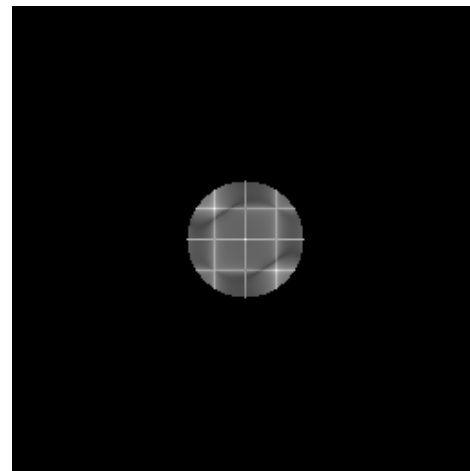
- window $\leq 2 \times$ size of smallest prominent feature

Natural to cast this in the *Fourier domain*

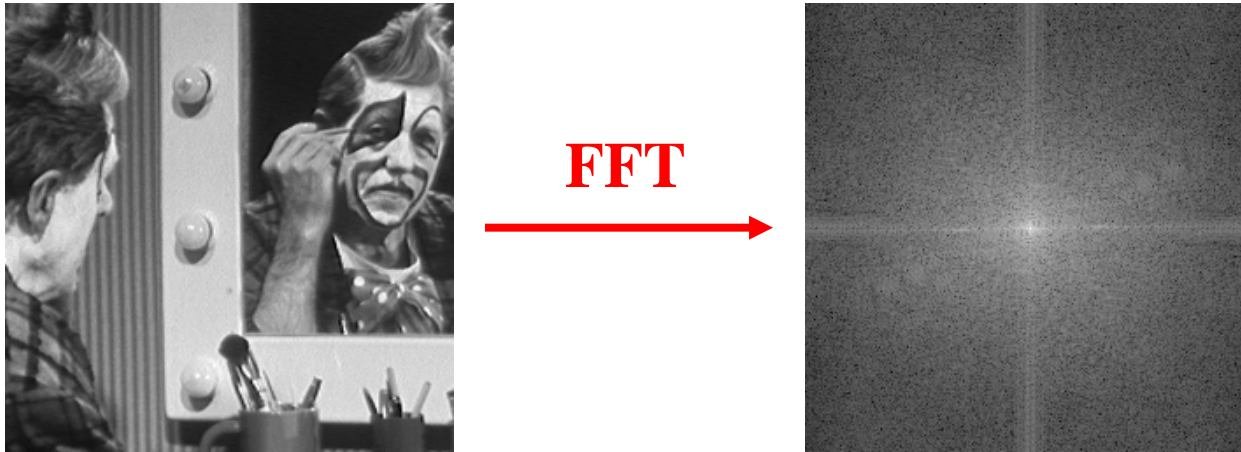
- largest frequency $\leq 2 \times$ size of smallest frequency
- image frequency content should occupy one “octave” (power of two)



FFT



What if the Frequency Spread is Wide



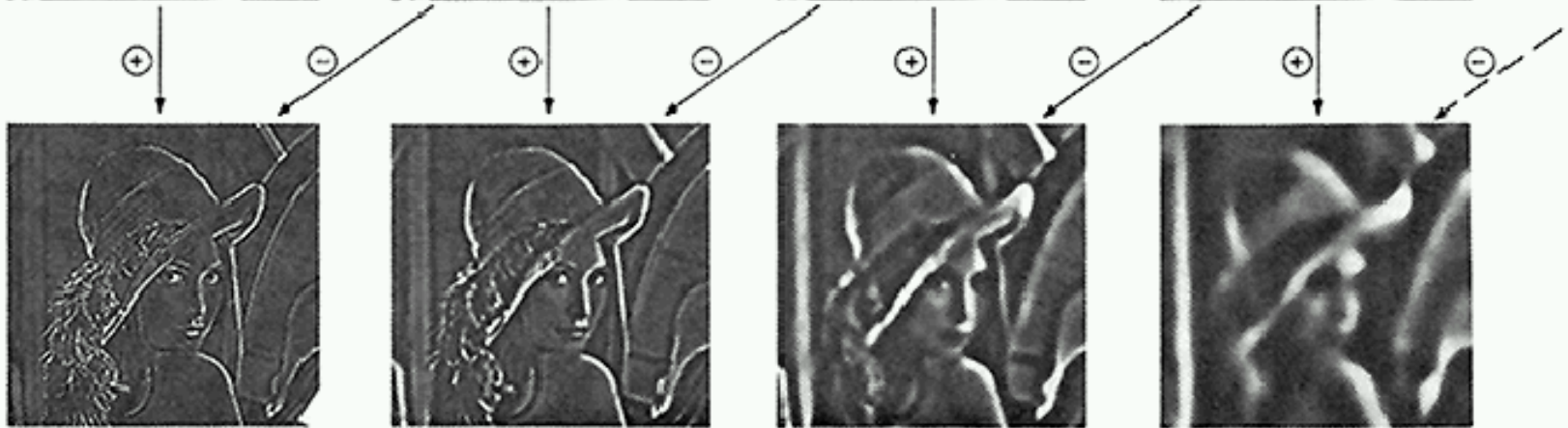
Idea (Burt and Adelson)

- Compute $F_{\text{left}} = \text{FFT}(I_{\text{left}})$, $F_{\text{right}} = \text{FFT}(I_{\text{right}})$
- Decompose Fourier image into octaves (bands)
 - $F_{\text{left}} = F_{\text{left}}^1 + F_{\text{left}}^2 + \dots$
- Feather corresponding octaves F_{left}^i with F_{right}^i
 - Can compute inverse FFT and feather in spatial domain
- Sum feathered octave images in frequency domain

Better implemented in *spatial domain*

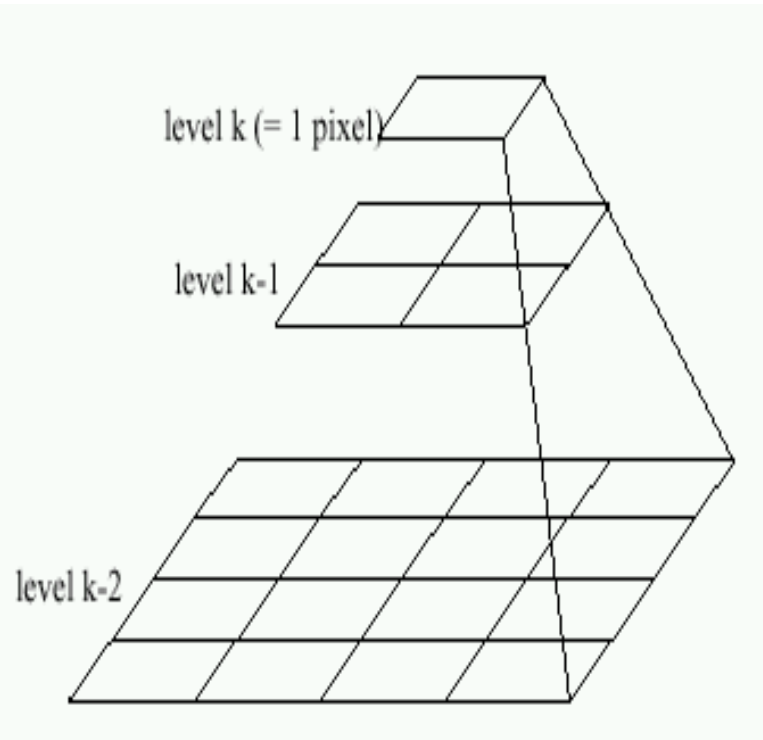
Octaves in the Spatial Domain

Lowpass Images

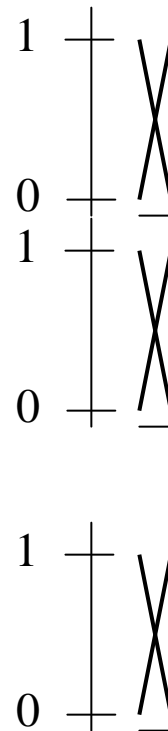


Bandpass Images

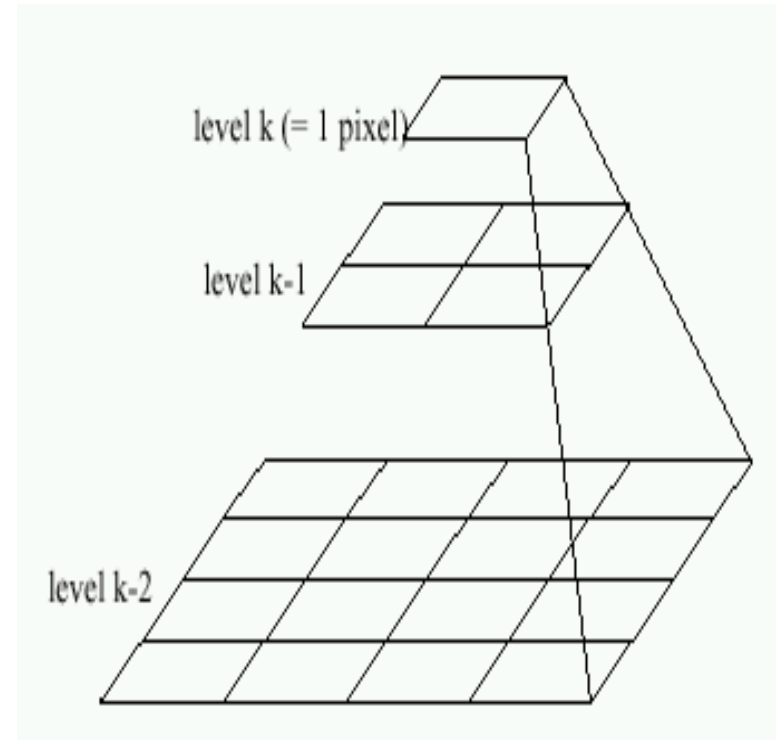
Pyramid Blending



Left pyramid

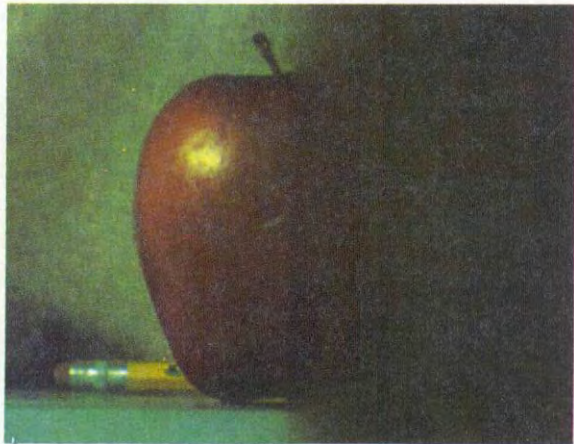
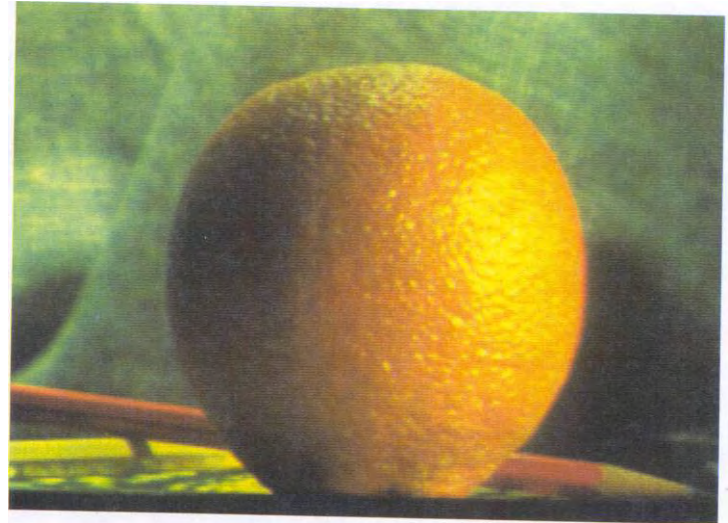
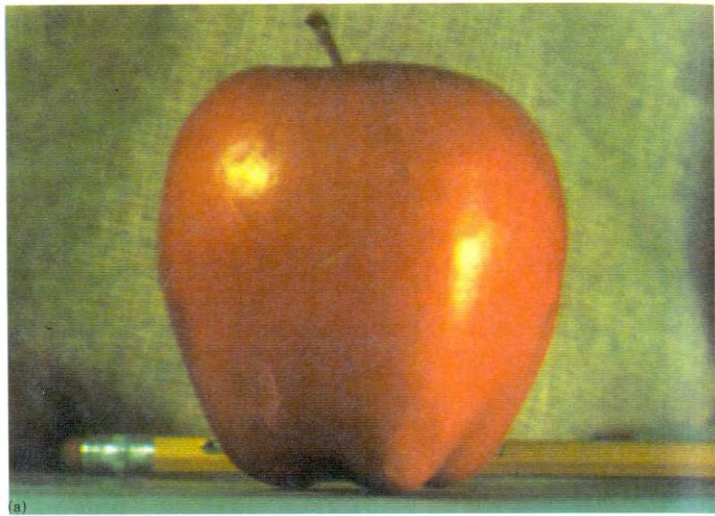


blend

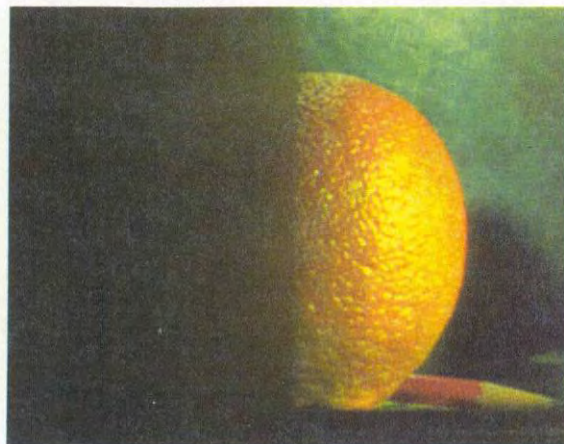


Right pyramid

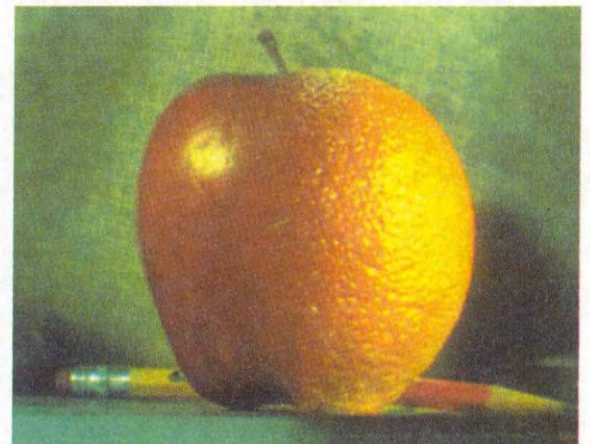
Pyramid Blending



(d)

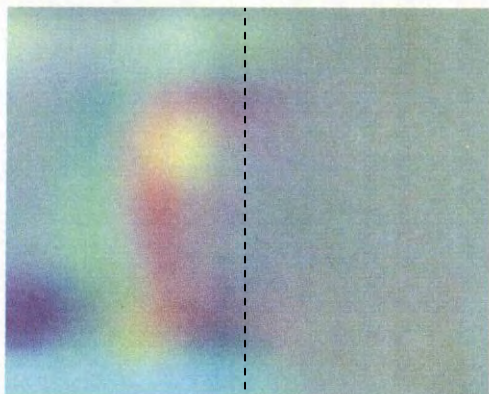


(h)

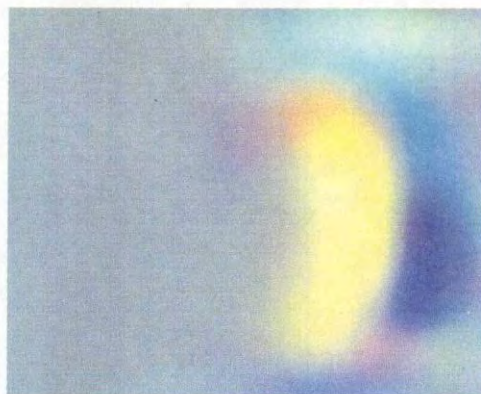


(l)

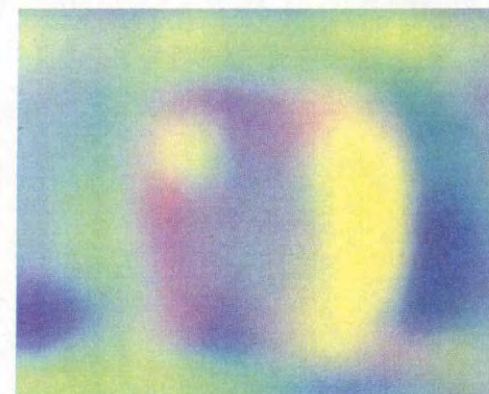
laplacian
level
4



(c)

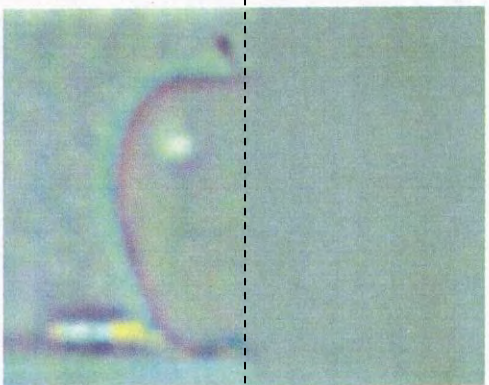


(g)

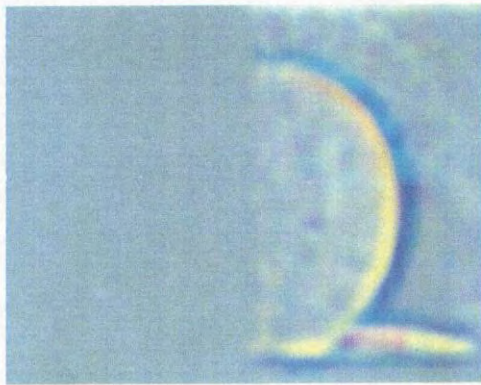


(k)

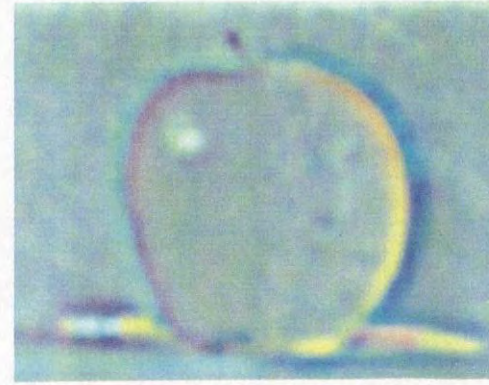
laplacian
level
2



(b)

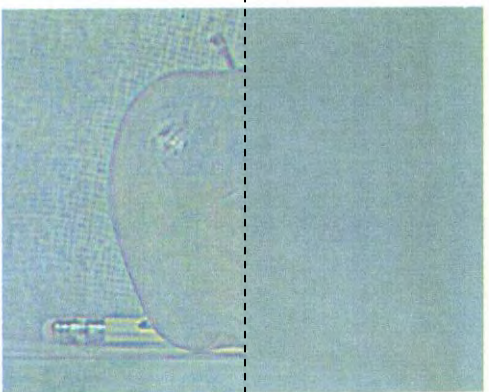


(f)

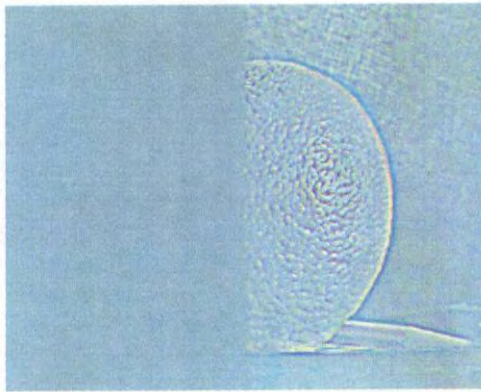


(j)

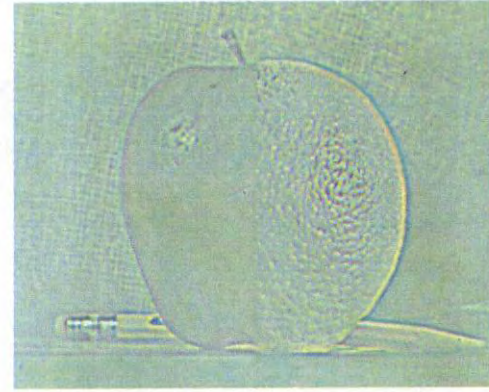
laplacian
level
0



(a)



(e)



(i)

left pyramid

right pyramid

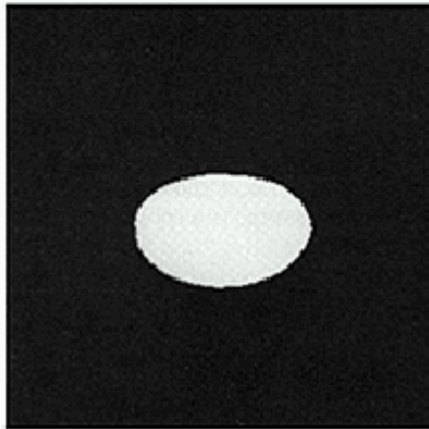
blended pyramid

Laplacian Pyramid: Blending

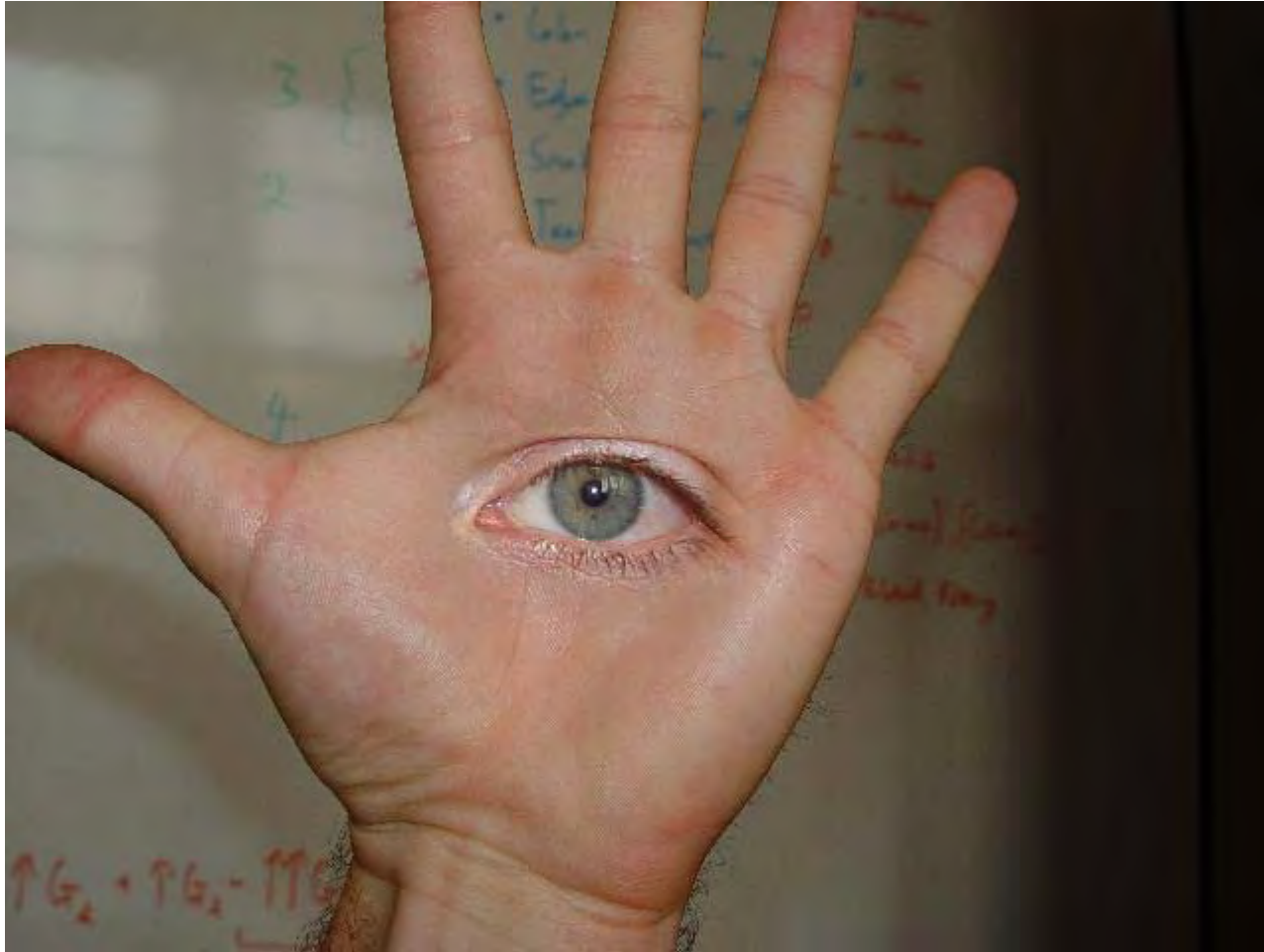
General Approach:

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:
 - $LS(i,j) = GR(l,j) * LA(l,j) + (1 - GR(l,j)) * LB(l,j)$
4. Collapse the LS pyramid to get the final blended image

Blending Regions



Horror Photo



© david dmartin (Boston College)

Results from this class (fall 2005)



© Chris Cameron

Season Blending (St. Petersburg)



Season Blending (St. Petersburg)



9:13:13 29-OCT-1998



10:24:59 15-NOV-1998

Simplification: Two-band Blending

Brown & Lowe, 2003

- Only use two bands: high freq. and low freq.
- Blends low freq. smoothly
- Blend high freq. with no smoothing: use binary alpha



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

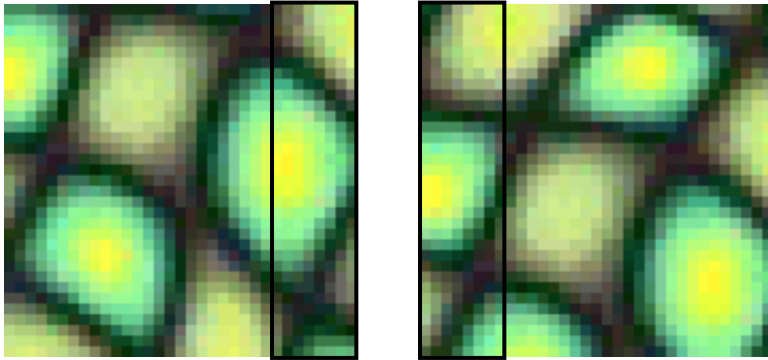
Segment the mosaic

- Single source image per segment
- Avoid artifacts along boundaries
 - Dijkstra's algorithm

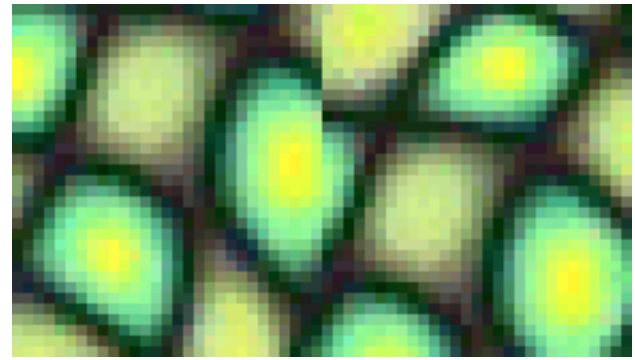


Minimal error boundary

overlapping blocks

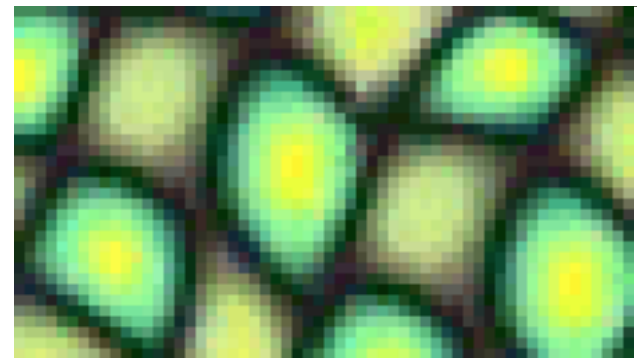


vertical boundary



A diagram showing the calculation of overlap error. It features two vertical blocks of the cell image, one to the left of the other. A large left square bracket is to the left of the blocks, and a large right square bracket is to the right. Between the blocks is a minus sign. To the right of the right bracket is a superscript '2'. This is followed by an equals sign and a vertical strip of the cell image. A jagged red line runs vertically through the strip, representing the boundary where the error is minimized.

overlap error



min. error boundary

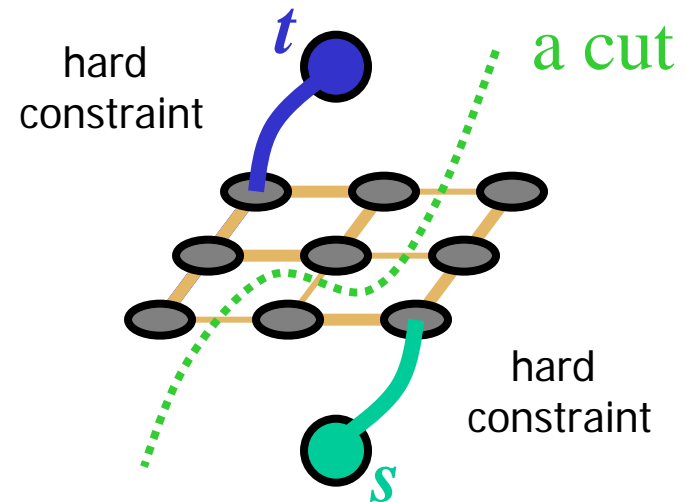
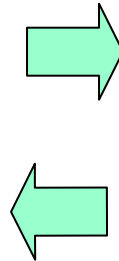
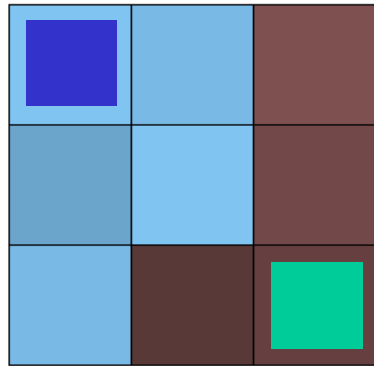
Graphcuts

What if we want similar “cut-where-things-agree” idea, but for closed regions?

- Dynamic programming can't handle loops

Graph cuts

(simple example à la Boykov&Jolly, ICCV'01)



Minimum cost cut can be computed in polynomial time
(max-flow/min-cut algorithms)

Kwatra et al, 2003



Actually, for this example, DP will work just as well...

Lazy Snapping



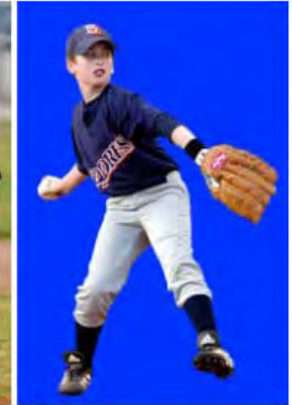
(a) Girl (4/2/12)



(b) Ballet (4/7/14)



(c) Boy (6/2/13)



(c) Grandpa (4/2/11)



(d) Twins (4/4/12)



Interactive segmentation using graphcuts

Gradient Domain

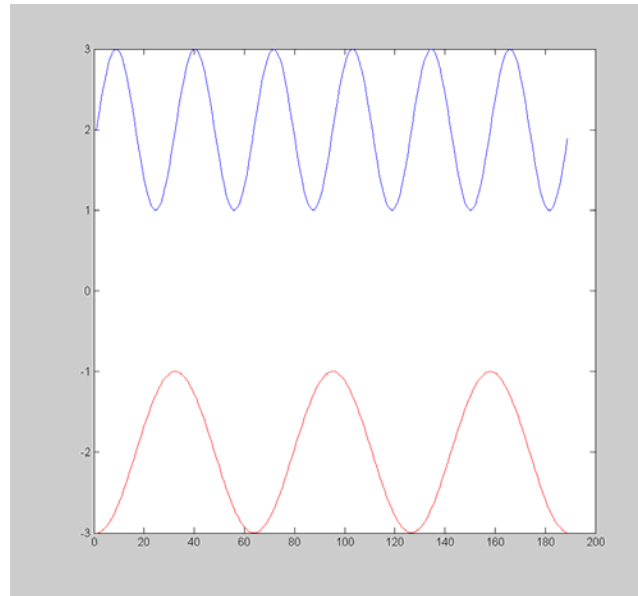
In Pyramid Blending, we decomposed our image into 2nd derivatives (Laplacian) and a low-res image

Let us now look at 1st derivatives (gradients):

- No need for low-res image
 - captures everything (up to a constant)
- Idea:
 - Differentiate
 - Blend
 - Reintegrate

Gradient Domain blending (1D)

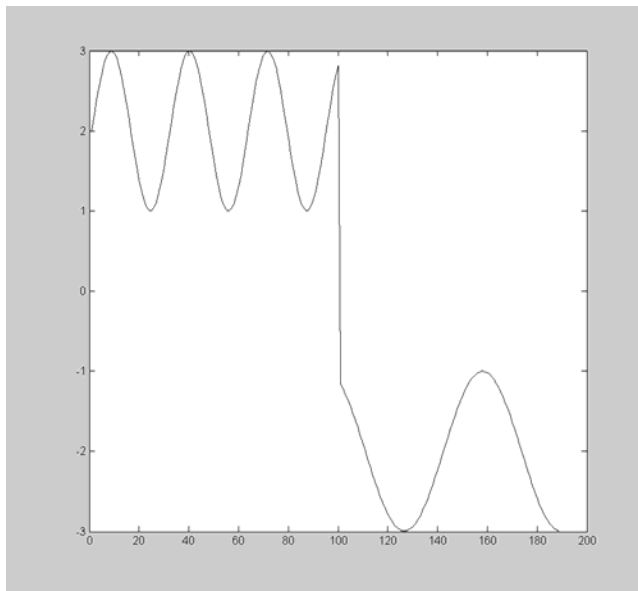
Two
signals



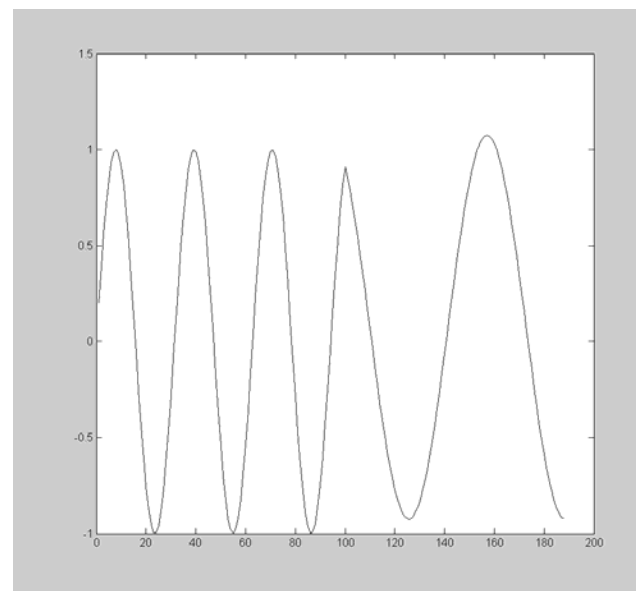
bright

dark

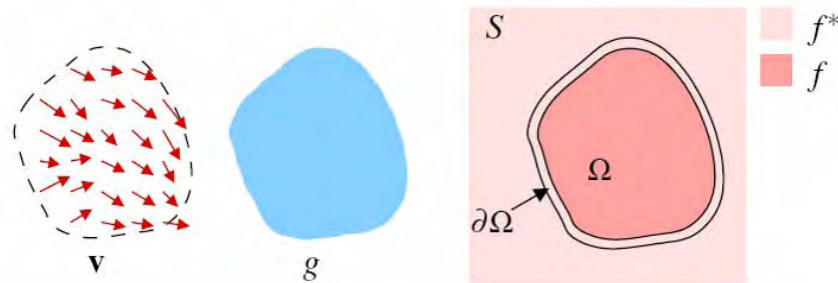
Regular
blending



Blending
derivatives



Gradient Domain Blending (2D)



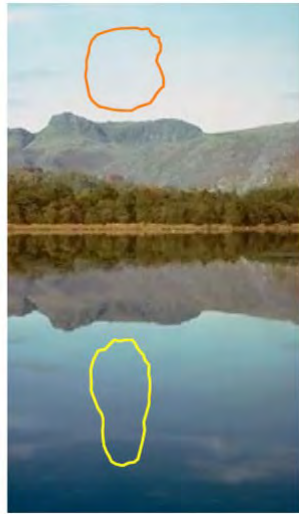
Trickier in 2D:

- Take partial derivatives dx and dy (the gradient field)
- Fiddle around with them (smooth, blend, feather, etc)
- Reintegrate
 - But now $\text{integral}(dx)$ might not equal $\text{integral}(dy)$
- Find the most agreeable solution
 - Equivalent to solving Poisson equation
 - Can use FFT, deconvolution, multigrid solvers, etc.

Perez et al., 2003



sources



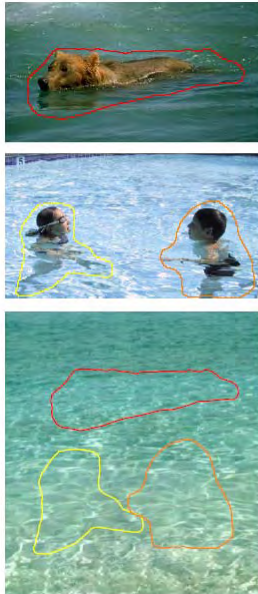
destinations



cloning



seamless cloning



sources/destinations



cloning



seamless cloning

Perez et al, 2003



editing

Limitations:

- Can't do contrast reversal (gray on black -> gray on white)
- Colored backgrounds "bleed through"
- Images need to be very well aligned

Painting in Gradient Domain! (McCann)

Real-Time Gradient-Domain Painting

James McCann*
Carnegie Mellon University

Nancy S. Pollard†
Carnegie Mellon University



Code available!

See Jim's talk this Friday:

James McCann

Real-Time Gradient-Domain Painting, 12:00 p.m.,
5409 Wean Hall

Putting it all together

Compositing images

- Have a clever blending function
 - Feathering
 - Center-weighted
 - blend different frequencies differently
 - Gradient based blending
- Choose the right pixels from each image
 - Dynamic programming – optimal seams
 - Graph-cuts

Now, let's put it all together:

- Interactive Digital Photomontage, 2004 (video)

Interactive Digital Photomontage

Aseem Agarwala, Mira Dontcheva
Maneesh Agrawala, Steven Drucker, Alex Colburn
Brian Curless, David Salesin, Michael Cohen

