# Image Stitching II 

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## RANSAC for Homography



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## Image Blending



## Feathering



## Effect of window (ramp-width) size



## Effect of window size



## Good window size



What can we do instead?
"Optimal" window: smooth but not ghosted

- Doesn't always work...


## Pyramid blending



Create a Laplacian pyramid, blend each level

- Burt, P. J. and Adelson, E. H., A Multiresolution Spline with Application to Image Mosaics, ACM Transactions on Graphics, 42(4), October 1983, 217-236. http://persci.mit.edu/pub_pdfs/spline83.pdf


## Blending comparison (IJCV 2007)


(a) Linear blending

(b) Multi-band blending

## Alpha Blending



Optional: see Blinn (CGA, 1994) for details:
http://ieeexplore.ieee.org/iel1/38/7531/00310740.pdf?isNumber =7531\&prod=JNL\&arnumber=310740\&arSt=83\&ared=87\&arAu hor=Blinn\%2C+J.F.

Encoding blend weights: $\mathrm{I}(\mathrm{x}, \mathrm{y})=(\alpha \mathrm{R}, \alpha \mathrm{G}, \alpha \mathrm{B}, \alpha)$
color at $\mathrm{p}=\frac{\left(\alpha_{1} R_{1}, \alpha_{1} G_{1}, \alpha_{1} B_{1}\right)+\left(\alpha_{2} R_{2}, \alpha_{2} G_{2}, \alpha_{2} B_{2}\right)+\left(\alpha_{3} R_{3}, \alpha_{3} G_{3}, \alpha_{3} B_{3}\right)}{\alpha_{1}+\alpha_{2}+\alpha_{3}}$
Implement this in two steps:

1. accumulate: add up the (a premultiplied) RGB values at each pixel
2. normalize: divide each pixel's accumulated RGB by its $\alpha$ value

## Gain Compensation: Getting rid of artifacts

- Simple gain adjustment
- Compute average RGB intensity of each image in overlapping region
- Normalize intensities by ratio of averages



## Blending Comparison


(b) Without gain compensation

(c) With gain compensation

(d) With gain compensation and multi-band blending

## Recognizing Panoramas



## Recognizing Panoramas

Input: N images

1. Extract SIFT points, descriptors from all images
2. Find $K$-nearest neighbors for each point ( $K=4$ ) (from the OTHER images)
3. For each image
a) Select $M$ candidate matching images by counting matched keypoints in other images ( $\mathrm{m}=6$ )
b) Solve homography $\mathbf{H}_{\mathrm{ij}}$ for each matched image


What else matches?

## Recognizing Panoramas

Input: N images

1. Extract SIFT points, descriptors from all images
2. Find K-nearest neighbors for each point ( $K=4$ )
3. For each image
a) Select $M$ candidate matching images by counting matched keypoints ( $m=6$ )
b) Solve homography $\mathbf{H}_{\mathrm{ij}}$ for each matched image
c) Decide if match is valid $\left(n_{i}>8+0.3, n_{f}\right)$

## Recognizing Panoramas (cont.)

(now we have matched pairs of images)
4. Make a graph of matched pairs

Find connected components of the graph


## Finding the panoramas



## Finding the panoramas



## Recognizing Panoramas (cont.)

(now we have matched pairs of images)
4. Find connected components
5. For each connected component
a) Solve for rotation and f
b) Project to a surface (plane, cylinder, or sphere)
c) Render with multiband blending

## Finding the panoramas



