









## PHOTO STITCHING AND BLENDING

Using SIFT, RANSAC, Laplacian Pyramids

### MAIN REFERENCES

- PanoramalmageStitching Yupan Huang
  <a href="https://github.com/HYPJUDY/panorama-image-stitching">https://github.com/HYPJUDY/panorama-image-stitching</a>
- OpenCV panorama stitching Adrian Rosebrock <a href="https://www.pyimagesearch.com/2016/01/11/opencv-panorama-stitching/">https://www.pyimagesearch.com/2016/01/11/opencv-panorama-stitching/</a>
- Referenced Paper: Automatic Panoramic Image Stitching using Invariant Features Matthew Brown and David G. Lowe <a href="http://matthewalunbrown.com/papers/ijcv2007.pdf">http://matthewalunbrown.com/papers/ijcv2007.pdf</a>

### PROBLEM DEFINITION

- ☐ Take as input two or more photos of the same view.
- ☐ Find overlapping regions and stitch the regions after aligning and warping as needed.
- □Clean up the output to minimize visibility of the seams and differences in color.

### **IMPLEMENTATION**

- □Create an adjacency list and Boolean table for the input photos
- ■Extract SIFT features for each photo
- □Choose the center image, in the current version a particular index, as the first incomplete stitch and add to work list
- Repeat until no photos left
  - Pop first index off the work list
  - For each adjacent photo in the adjacency list
    - ☐ Insert the index to the work list
    - Extract SIFT features for the last stitch
    - Compute Homography between the last stitch and the adjacent photo using RANSAC
    - Using Homography matrix, find the output dimensions and warp the adjacent photo into place
    - Blend the last stitch and the warped adjacent photo to get the new stitch
- Remove black regions from the stitched image to get the final output Panorama

### SIFT — SCALE INVARIANT FEATURE TRANSFORM

#### ☐ Create Scale Spaces

- Repeatedly apply Gaussian blur to the original image.

  Each set of the original image and progressively blurred images together form an octave
- Resize by the original half and generate another octave
- ☐ The author of the SIFT paper suggests four levels of octaves

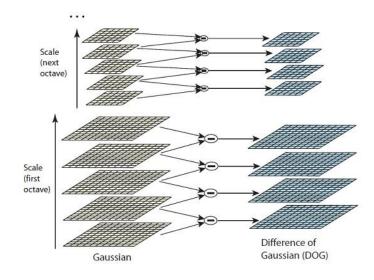
#### ☐ Construct LoG Approximations

Difference of Gaussian, ie. pairs of consecutive images in an octave are subtracted, used to get Laplacian of Gaussians then used to find features



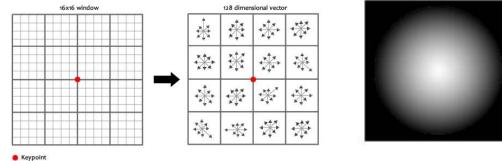
$$L(x, y, \sigma) = G(x, y, \sigma) * I(x, y)$$

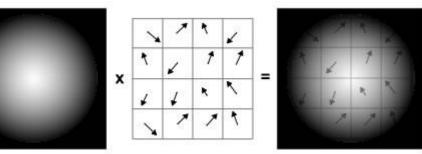
$$G(x,y,\sigma) = \frac{1}{2\pi\sigma^2} e^{-(x^2+y^2)/2\sigma^2}$$



# SIFT (CONTINUED)

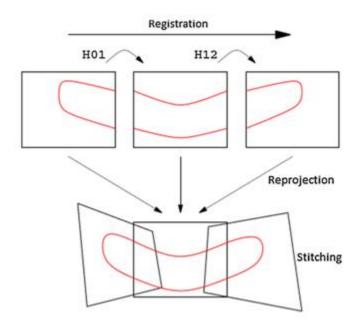
- □Key points are calculated using maxima and minima between different Gaussian scales
- Low contrast and edges which are bad key points are removed using LoG
- Assign orientation to the key points using gradients from the Gaussian scales
- $\square$  Generate SIFT features each a 128 dimension representing 16x16 window for that feature





### HOMOGRAPHY

RANSAC (Random Sample Consensus) is then used to calculate the Homography between two photos to project onto a common plane



### LAPLACIAN PYRAMID BLENDING

- Create the Gaussian Pyramid by consecutively applying Gaussian blur and resizing to half its dimensions.
- Construct the Laplacian Pyramid by doubling the smaller image and then subtracting from former level.  $L_i=G_i$ -expand $(G_i+1)$
- Create Blend Laplacian Pyramid by applying mask between two images to be stitched
- By reversing the Laplacian Pyramid, reconstruct a blended Gaussian Pyramid.  $G_i = L_i + \exp(G_i + 1)$  and  $G_0$  is the final stitch.

Applying cylindrical warping to the input creates more uniform detail in the final output by reducing horizontal distortion. Ideally we use camera parameters for the cylindrical projection.



# THANK YOU