

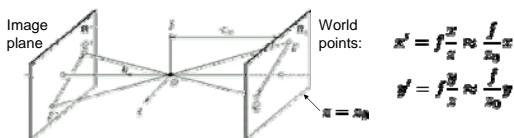
Thursday, Oct 16

## Today

- Pset1 examples
- Midterm solutions
- Homography recap, computing mosaics

## Weak perspective

- Approximation: treat magnification as constant
- Assumes scene depth  $\ll$  average distance to camera



- Write matrix equation that relates world point (X,Y,Z) to its image point according to weak perspective.

Which is more suited for weak perspective projection model?

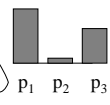
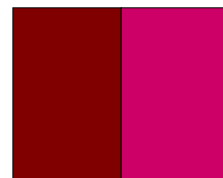


## Color matching experiment 2



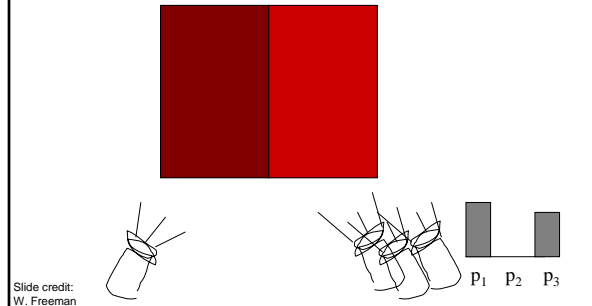
Slide credit:  
W. Freeman

## Color matching experiment 2



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W. Freeman

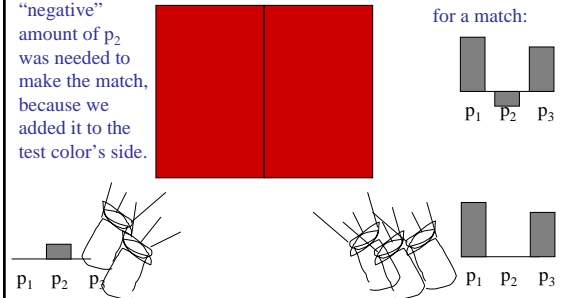
## Color matching experiment 2



## Color matching experiment 2

We say a "negative" amount of  $p_2$  was needed to make the match, because we added it to the test color's side.

The primary color amounts needed for a match:



$$a = \begin{bmatrix} 1 & 0 \\ -1 & 0 \end{bmatrix} \quad b = \begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix} \quad c = \begin{bmatrix} -1 & 0 \\ 0 & 1 \end{bmatrix}$$

[5, 12, 5, 9, 8, 9, 5, 5, 12, 12, 5, ?]

## K-means

- Suppose we are using  $k$ -means clustering to group pixels in a (tiny) image based on their intensity. The image's intensities are: 5, 10, 3, 20, 9, 0. We pick the initial centers randomly to be 0 and 9, and set the number of clusters  $k=2$ .
- Cluster membership?
- New cluster centers?

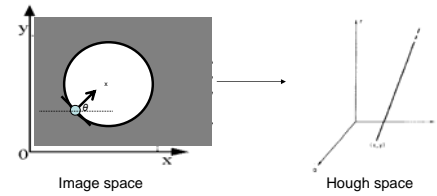


- Affinity score that will discourage intervening contours between pixels.

## Hough transform for circles

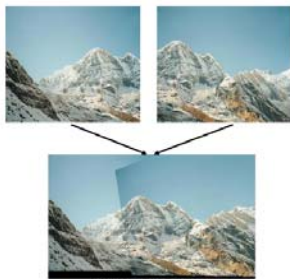
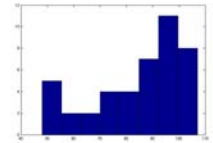
- Circle: center  $(a,b)$  and radius  $r$   

$$(x_i - a)^2 + (y_i - b)^2 = r^2$$
- For an unknown radius  $r$ , **known** gradient direction



## Midterm

- Average overall: 83.8 (+/- 17.5)
- Undergrad average: 79 (+/- 18)
- Grad average: 97 (+/- 6)
- Question 5 treated as extra credit (8 pts possible)
- 100+ = A+, 95:99 = A, 90:94 = A-
- 85:89 = B+, 80:84 = B, 75:79 = B-
- 70:74 = C+, 65:69 = C, 60:64 = C-
- 50:60 = D

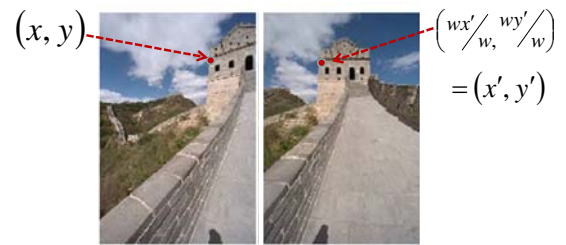


## Mosaics: main steps

- Collect correspondences (manually)
- Solve for homography matrix  $H$
- Warp content from one image frame to the other to combine: say  $im1$  into  $im2$  reference frame
- Overlay  $im2$  content onto the warped  $im1$  content.

- **ginput** to collect clicked points
- What kinds of images to choose as input?

## Homography



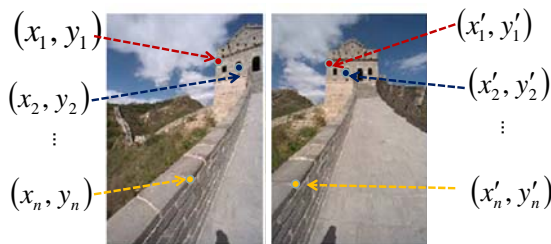
To **apply** a given homography **H**

- Compute  $\mathbf{p}' = \mathbf{H}\mathbf{p}$  (regular matrix multiply)
- Convert  $\mathbf{p}'$  from homogeneous to image coordinates

$$\begin{bmatrix} wx' \\ wy' \\ w \end{bmatrix} = \begin{bmatrix} * & * & * \\ * & * & * \\ * & * & * \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

$\mathbf{p}' \quad \quad \mathbf{H} \quad \mathbf{p}$

## Homography



To **compute** the homography given pairs of corresponding points in the images, we need to set up an equation where the parameters of **H** are the unknowns...

## Solving for homographies

$$\mathbf{p}' = \mathbf{H}\mathbf{p}$$

$$\begin{bmatrix} wx' \\ wy' \\ w \end{bmatrix} = \begin{bmatrix} a & b & c \\ d & e & f \\ g & h & i \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Can set scale factor  $w=1$ . So, there are 8 unknowns.

Set up a system of linear equations:

$$\mathbf{A}\mathbf{h} = \mathbf{b}$$

where vector of unknowns  $\mathbf{h} = [a, b, c, d, e, f, g, h]^T$

Need at least 8 eqs, but the more the better...

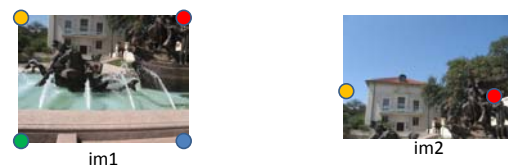
Solve for  $\mathbf{h}$ . If overconstrained, solve using least-squares:

$$\min \|\mathbf{A}\mathbf{h} - \mathbf{b}\|^2$$

>> `help imdivide`

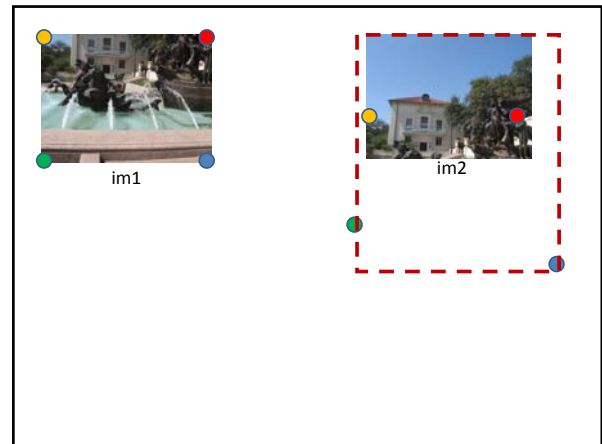
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- **Collect correspondences (manually)**
- **Solve for homography matrix **H****
  - Least squares solution
- **Warp content from one image frame to the other to combine: say im1 into im2 reference frame**
  - Determine bounds of the new combined image
    - Where will the corners of im1 fall in im2's coordinate frame?
    - We will attempt to lookup colors for any of these positions we can get from im1: `meshgrid`
  - Compute coordinates in im1's reference frame (via homography) for all points in that range:  $\mathbf{H}^{-1}$
  - Lookup all colors for all these positions from im1
    - Inverse warp: `interp2` (watch for nans: `isnan`)
- **Overlay im2 content onto the warped im1 content.**
  - Careful about new bounds of the output image: `minx, miny`



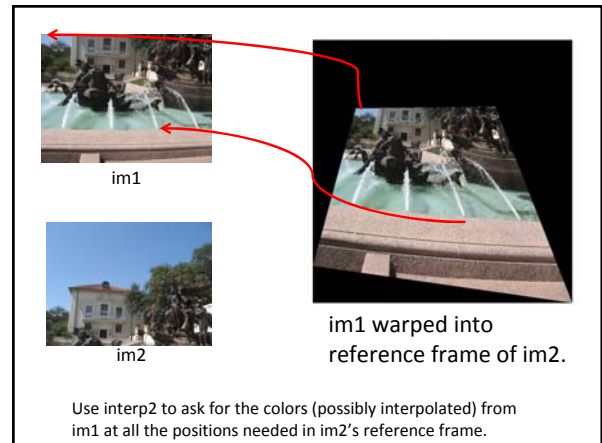
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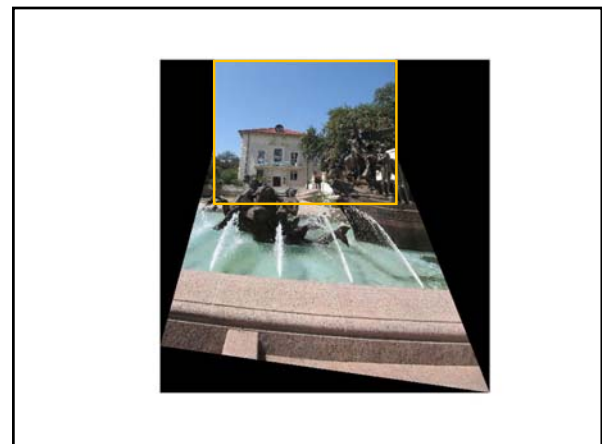
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## RANSAC for estimating homography

RANSAC loop:

1. Select four feature pairs (at random)
2. Compute homography  $H$  (exact)
3. Compute *inliers* where  $SSD(p_i', H p_i) < \varepsilon$
4. Keep largest set of inliers
5. Re-compute least-squares  $H$  estimate on all of the inliers

## Sanity checks

- Click on corresponding points, solve for  $H$ , then check that when you plot the transformed points from one image in the other, they land on the right features
- Do the same, but with the corners of one image.

## Misc matlab (from pset)

- Watch for index conventions: `ginput` gives back (x,y), while matrices are indexed in y,x order
- `uint8`'s vs. doubles; give `interp2` a matrix of doubles

## Possible interface

Main script

```
H = computeH(pts1, pts2)
```

```
[im1warped, minx, miny] =  
    warpImage(im1, H, im2h, im2w)
```

- For Tuesday:
  - Read F&P 10.1.1-10.1.2, F&P 11.1-11.3
  - [\[T&V Chapter 7\]](#)