

# Lecture 11 and 12: Stereo Vision

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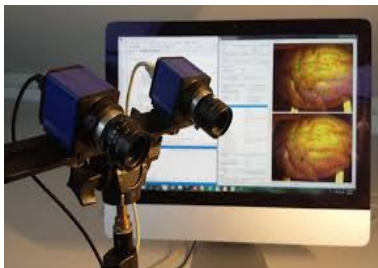
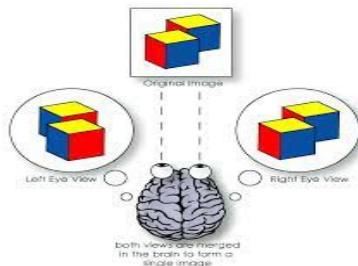
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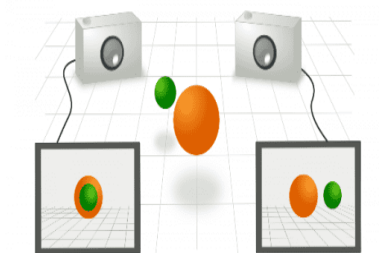


- 1 Goal of stereo vision
- 2 Visual cues for 3D
- 3 Estimating depth with stereo

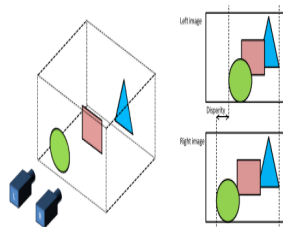
## To mimic human vision system



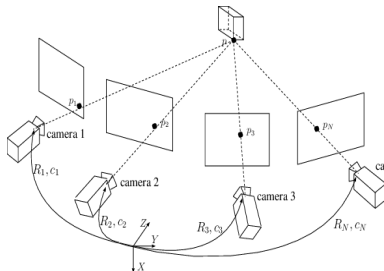
**What extra information captured by two cameras, compared to one**



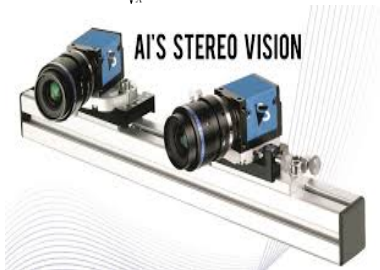
# Need of Stereo Vision



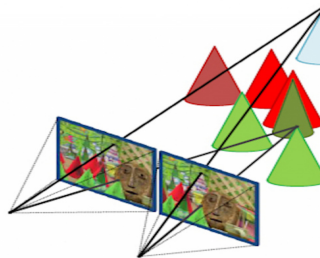
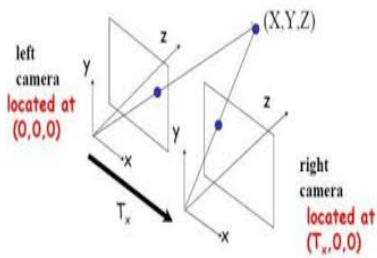
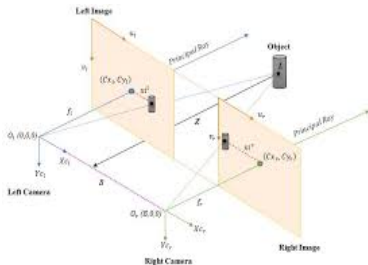
1. Goal of stereo Vision: The recovery of the 3D structure(3D points, shape etc) of a scene using two or more images of the 3D scene, each acquired from a different viewpoint in space.



2. The term binocular vision is used when two cameras are employed.



# Goal of stereo vision (cont.)





When we look at image, what properties indicate the differences in depth or provide hints about object's shape?











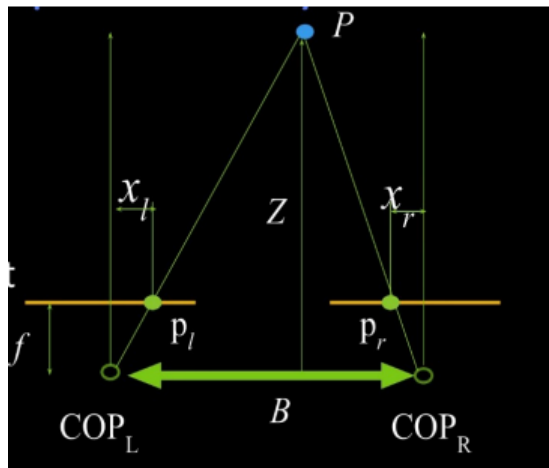


- ▶  $X$  = shading, texture, focus, motion, ...
- ▶ We'll focus on the motion cue



- ▶ Stereo : Shape from motion between the two views
- ▶ We need to consider
  - Reconstruction
  - Correspondence
- ▶ Assuming the following constraints, let us find depth
  - CCS of Camara 1 is aligned with WCS
  - X and Y axes of CCS1 and CCS2 are the same
  - Origin of CCS 2 is displaced from the origin of CCS 1 by  $(B, 0, 0)$

# Geometry for a stereo system





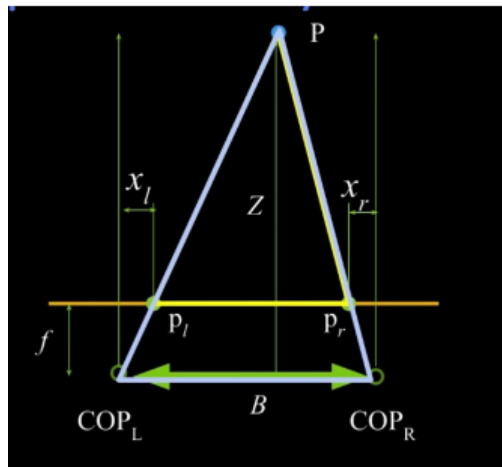
- ▶  $B$  is baseline width, distance between centres of the cameras
- ▶ **Defn of depth:** The distance between a point  $p$  and the baseline is called as depth of  $p$

## Observe that:

- ▶ Two Image planes are coplanar
- ▶ Image planes at the front of image camera
- ▶ Origins are at the center of the planes
- ▶ Displacement (from origin) is positive in left image and negative in right image
- ▶  $Z$  is the depth to be obtained from the two formed images.
- ▶  $f$  is the focal length.



# Geometry for a stereo system (cont.)





- ▶ Similar triangles  $(P_l, P, P_r)$  and  $(COP_L, P, COP_R)$

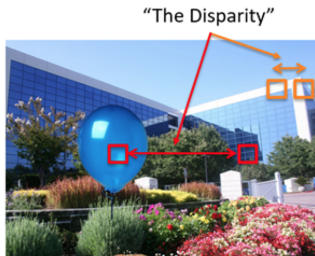
$$\frac{B - x_l + x_r}{Z - f} = \frac{B}{Z}$$
$$Z = \frac{f B}{x_l - x_r}$$

- ▶  $x_l - x_r$  is called as disparity
- ▶ Depth is inversely proportional to Disparity

# Disparity map



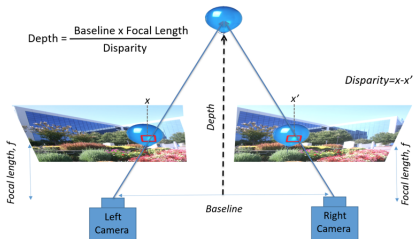
Left camera



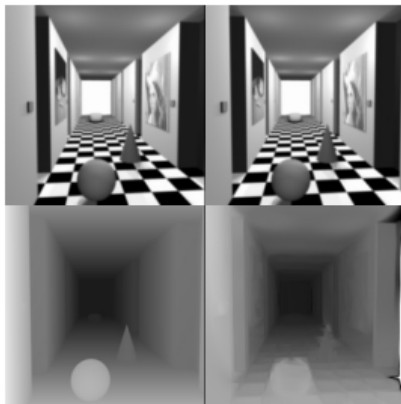
Right camera

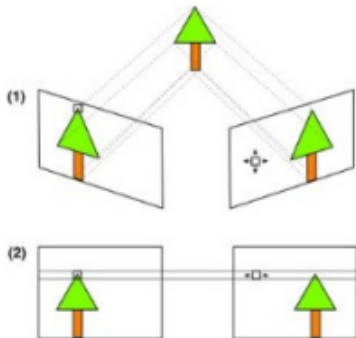


Disparity Map referenced to Right camera



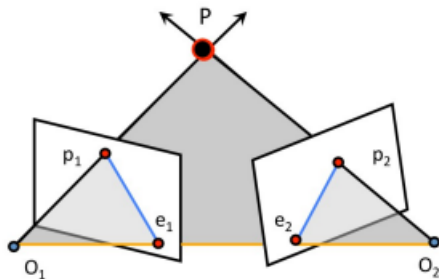
# Disparity map





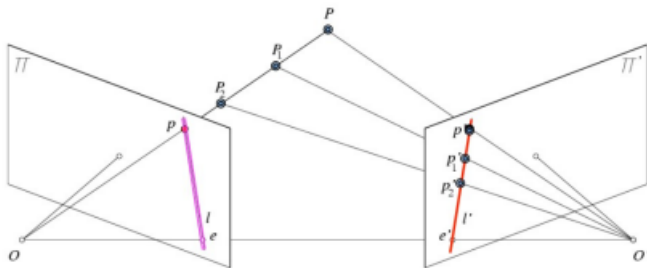
**Search problem:** Given an element in the left image, we search for the element in the right image. This involves two decisions:

- ▶ Which image element to match
- ▶ Which similarity measure to adopt



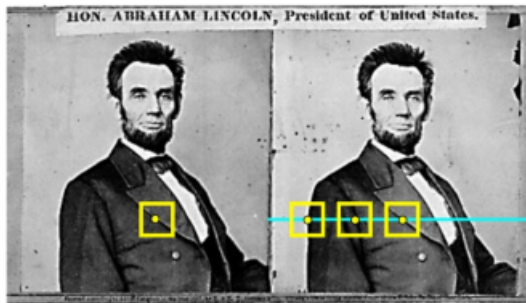
- ▶ The standard epipolar geometry setup involves two cameras observing the same 3D point  $P$ , whose projection in each of the image planes is located at  $p_1$  and  $p_2$ .
- ▶  $e_1$  and  $e_2$  are called epipoles.
- ▶ Epipolar line is the intersection of an epipolar plane with the image plane

# Epipolar Constraint



- ▶ Potential matches for  $p$  have to lie on the corresponding epipolar line  $r$
- ▶ Potential matches for  $p'$  have to lie on the corresponding epipolar line  $l$

# Why is the epipolar constraint useful?



The epipolar constraint reduces the correspondence problem to a 1D search along the epipolar line.

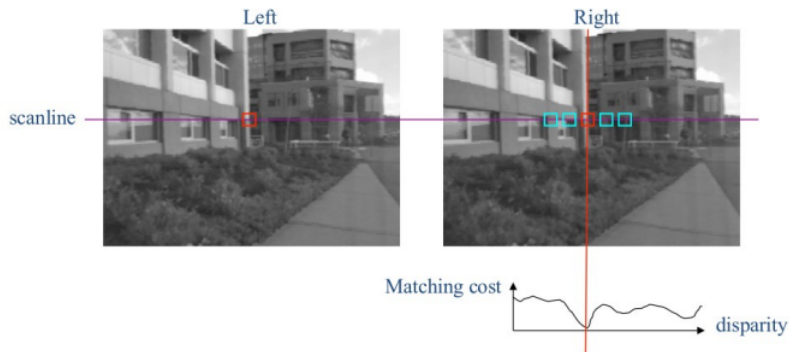




Beyond the constraint by epipolar geometry , there are other constraints to help identify corresponding points.

- ▶ **Similarity** - Image patch from the left should match with the right
- ▶ **Uniqueness** - There is no more than one match for the pixel in right image
- ▶ **Ordering** - If pixels go a,b,c in left, they go a,b,c in right
- ▶ **Disparity Gradient is limited** - Depth doesn't change too quickly

# Correspondence search with similarity constraint

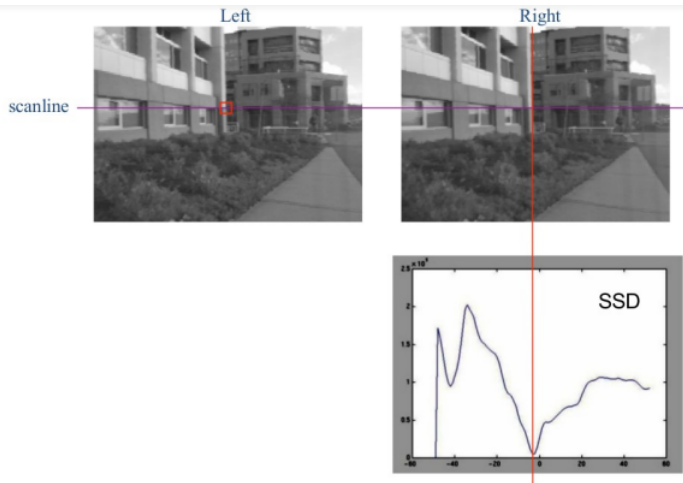


- ▶ Sum of Squares difference(SSD)
- ▶ Normalized Correlation

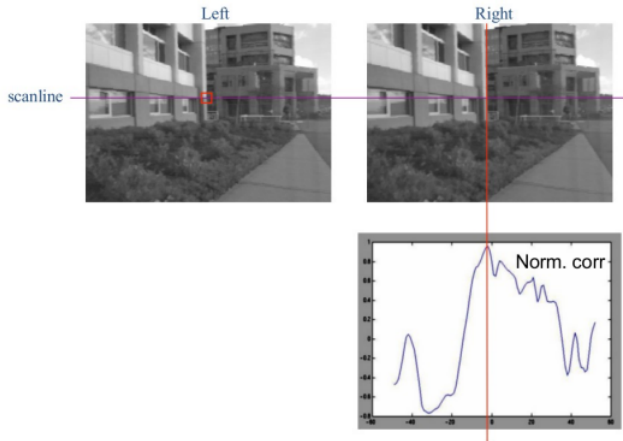
$$r_{ij} = \frac{\sum_m \sum_n [f(m+i, n+j) - \bar{f}][g(m+i, n+i) - \bar{g}]}{\sqrt{\sum_m \sum_n (f(m+i, n+j) - \bar{f})^2 \sum_m \sum_n (g(m+i, n+i) - \bar{g})^2}}$$

- ▶ Mutual Information

$$I(X; Y) = \int_y \int_x P(x, y) \log \left( \frac{P(x, y)}{P(x)P(y)} \right) dx dy$$

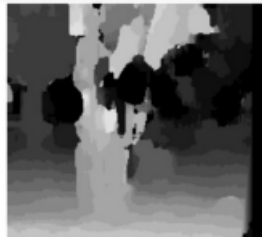


# Normalized Correlation





$W = 3$



$W = 20$

- ▶ Smaller window
  - More detail
  - Less noise
- ▶ Larger window
  - Smoother disparity maps
  - Less detail

# Disparity Map



(a)



(b)



(c)



- ▶ Low-contrast; Texture less image regions
- ▶ Occlusions
- ▶ Large base lines
- ▶ Camera calibration errors etc.,