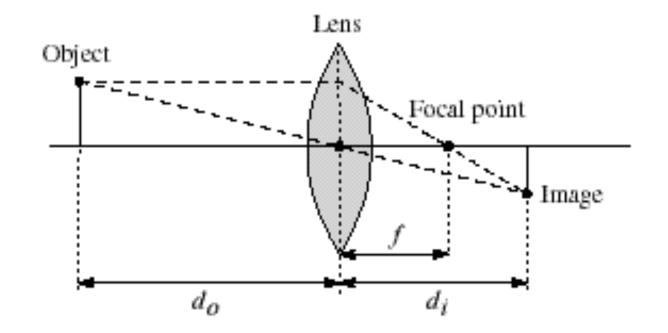
# Intro to Robotics

Lecture 15

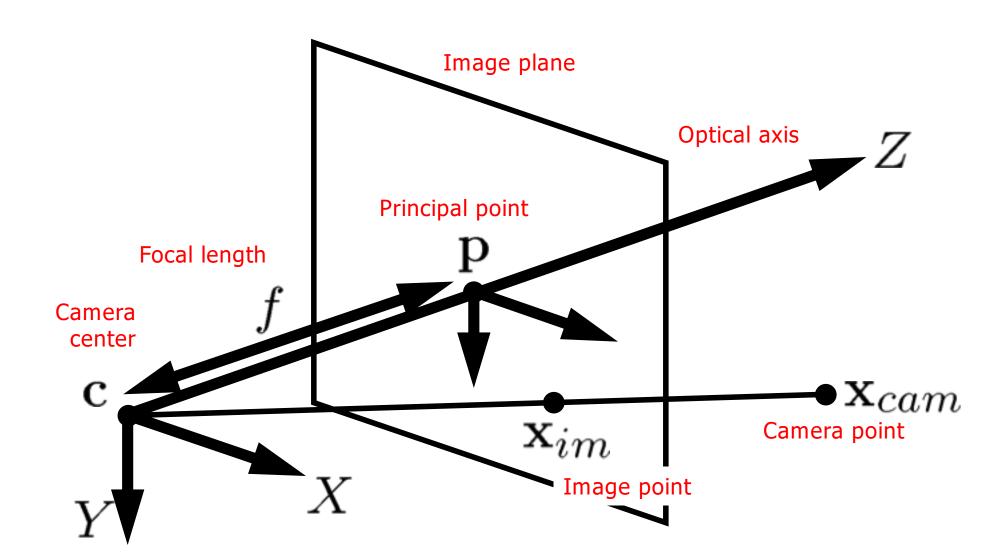
#### Thin Lens Model

• Thin lens equation:

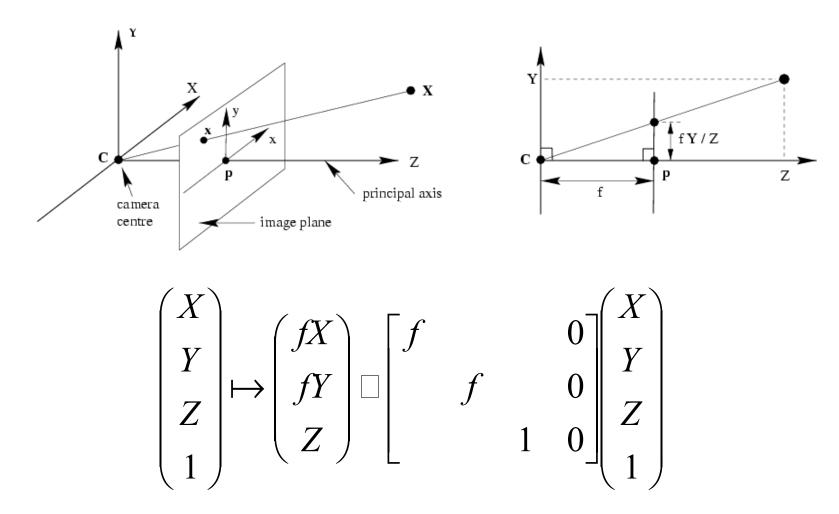
$$\frac{1}{d_o} + \frac{1}{d_i} = \frac{1}{f}$$



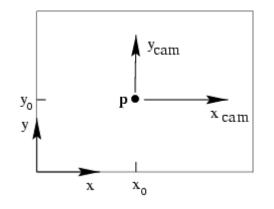
#### Pinhole Camera Model



#### Pinhole Camera Model



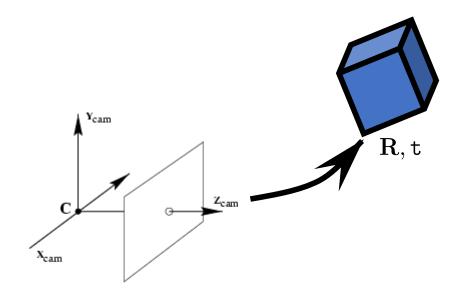
# Principal Point Offset



$$(p_x, p_y)^T$$
 principal point

$$\begin{pmatrix} X \\ Y \\ Z \\ 1 \end{pmatrix} \mapsto \begin{pmatrix} fX \square Zp_x \\ fY \square Zp_x \\ Z \end{pmatrix} \square \begin{bmatrix} f & p_x & 0 \\ f & p_y & 0 \\ 1 & 0 \end{bmatrix} \begin{pmatrix} X \\ Y \\ Z \\ 1 \end{pmatrix}$$

### Object in Camera Coordinate System

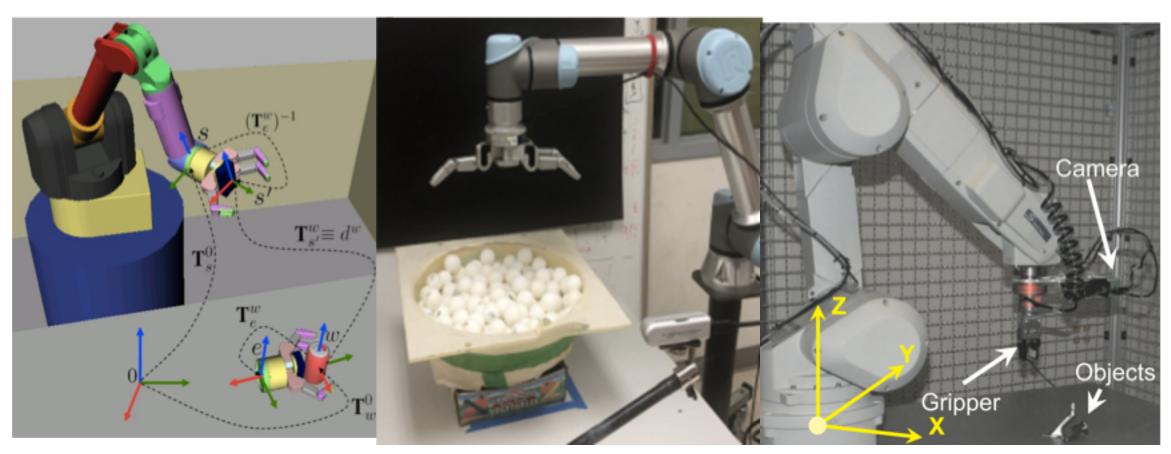


$$X_{cam} = \begin{bmatrix} \mathbf{R} & t \\ 0 & 1 \end{bmatrix} X_{obj}$$

$$X_{cam} = \begin{bmatrix} \mathbf{R} & \mathbf{t} \\ \mathbf{0} & \mathbf{1} \end{bmatrix} X_{obj}$$
  $\mathbf{x} = \mathbf{K} \begin{bmatrix} \mathbf{I} & \mathbf{0} \end{bmatrix} \begin{bmatrix} \mathbf{R} & \mathbf{t} \\ \mathbf{0} & \mathbf{1} \end{bmatrix} X_{obj}$ 

K – intrinsic parameter matrix

# Hand-Eye: Eye-in-Hand Eye-to-Hand



# General Projective Camera Model

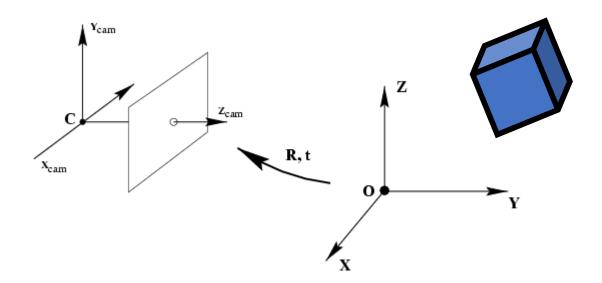
Simple ideal lens

- Different x and y focal length
- Lens distortion
- Center in pixels

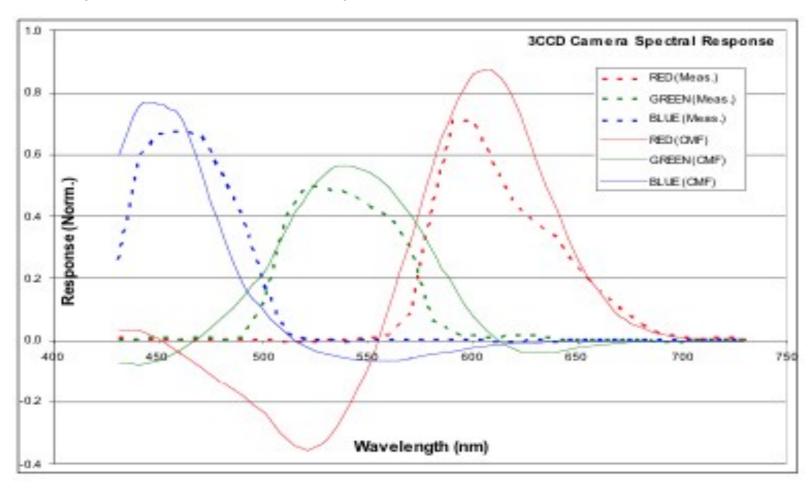
$$\mathbf{K} = \left[ \begin{array}{ccc} \alpha_x & s & x_0 \\ & \alpha_y & y_0 \\ & & 1 \end{array} \right]$$

### Camera in World Coordinate System

- Calibrate where the camera is in the world coordinate system
- Extrinsic parameter calibration



## Camera Spectral Response



http://www.definitionmagazine.com/journal/2010/5/7/capturing-colour.html

#### Images

- An image is a matrix of pixels  $\mathbf{I}(x,y)$
- Grayscale
  - 8 bits per pixel → Intensities in range [0...255]
  - 0-1 for intensity representation
- RGB color
  - Three 8-bit color channels  $\mathbf{I}_R, \mathbf{I}_G, \mathbf{I}_B$

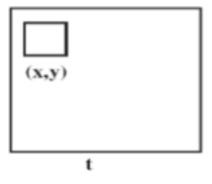
## Color Representation

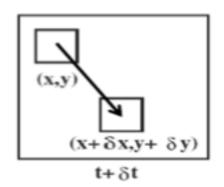
- RGB, HSV (hue, saturation, value), YUV, and other
- Adjust contract, brightness, gammar
- Chrominance: Perceived color
  - HS(V), (Y)UV, etc.
  - Normalized RGB removes some illumination dependence:

$$r = \frac{R}{R+G+B}, g = \frac{G}{R+G+B}$$

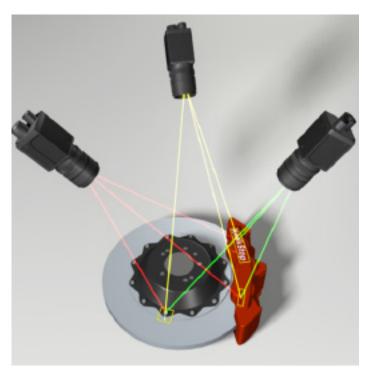
### Optical Flow

- Aperture problem: Can only determine optical flow component in gradient direction
- Brightness constancy insufficient to solve for general optical flow vector field
- Need other assumptions:
  - Assume flow field is smoothly varying (Horn, 1986)
  - Assume low-dimensional function describes motion





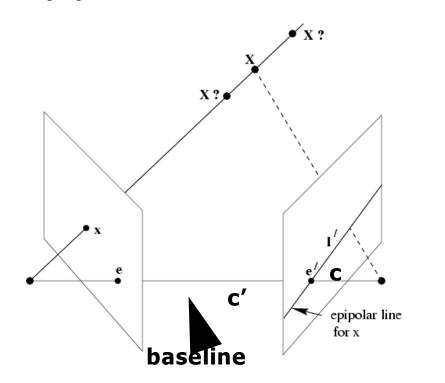
#### 3D Vision

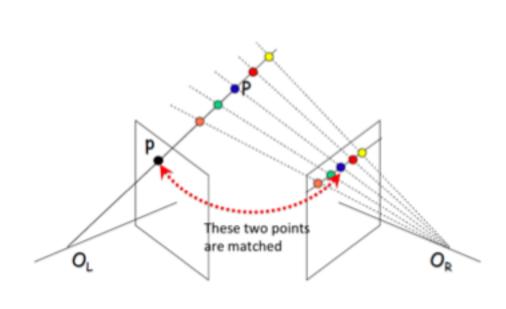


3D vision systems typically employ multiple cameras.

## **Epipolar Geometry**

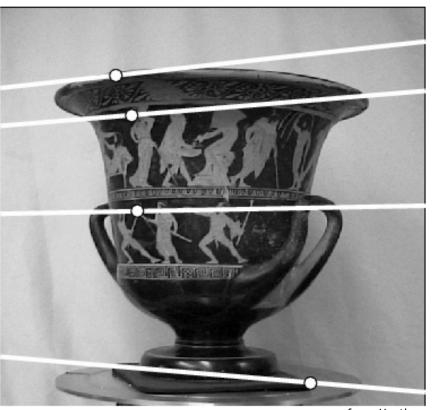
- **Epipoles**: Where baseline intersects image planes
- Epipolar plane: Any plane containing baseline
- Epipolar line: Intersection of epipolar plane with image plane





## Example: Epipolar Lines





Left view

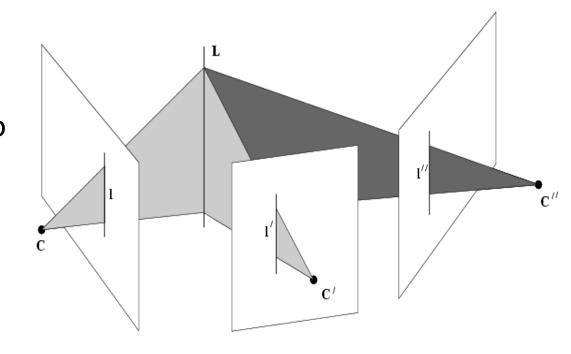
Right view

from Hartley & Zisserman

Known epipolar geometry constrains search for point correspondences

#### More Than Two Views

- Reconstruction methods
  - Bundle adjustment: Projective reconstruction from n views taking all into account simultaneously
  - Factorization: Affine reconstruction for *n* affine cameras (Tomasi & Kanade, 1992)



# Depth Camera



