



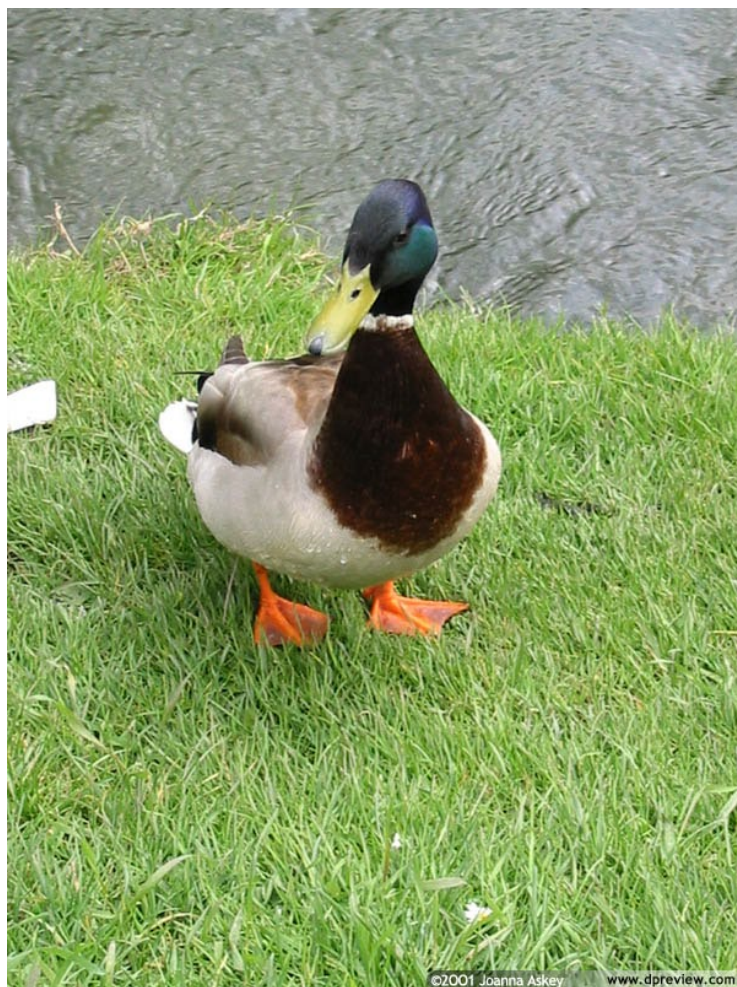
# Camera Models

CS535

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Department of Computer Science  
Purdue University



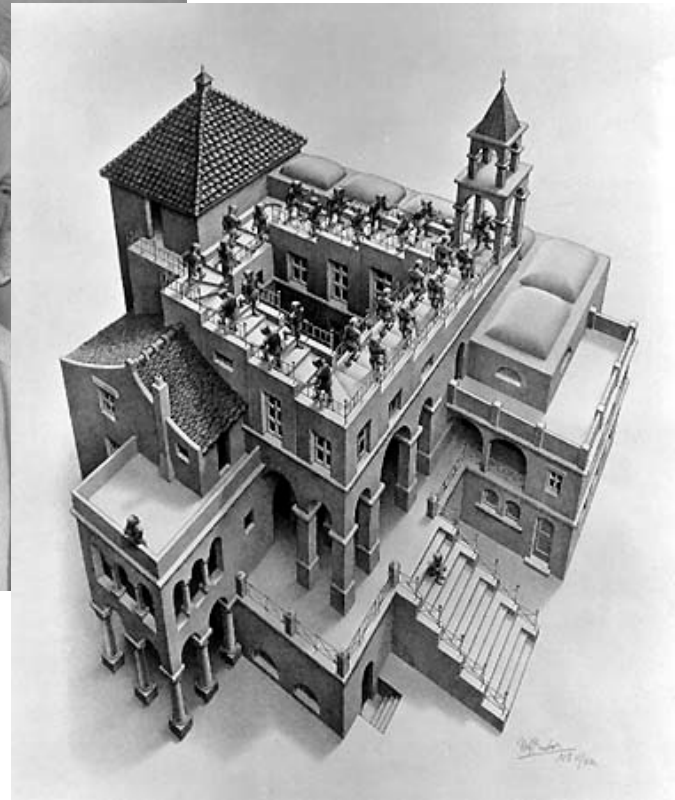
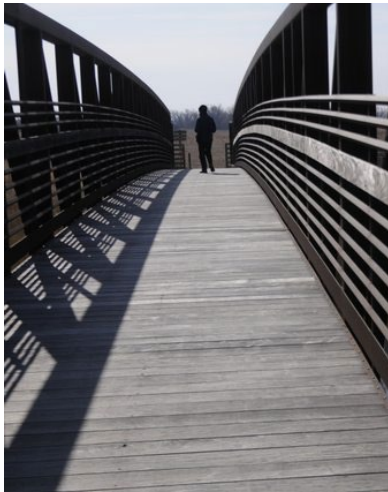
# Our (3D) World...





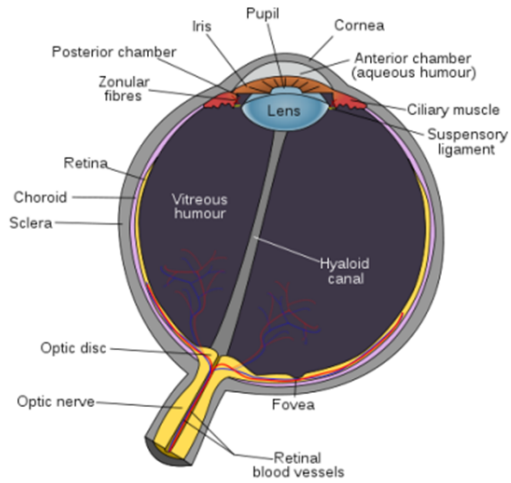
# What makes it 3D?

- Depth (...illusion)



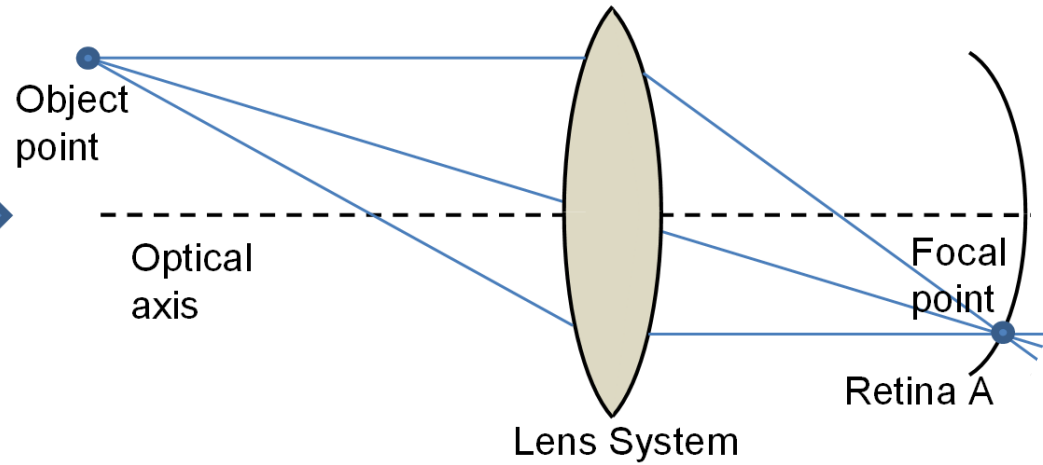
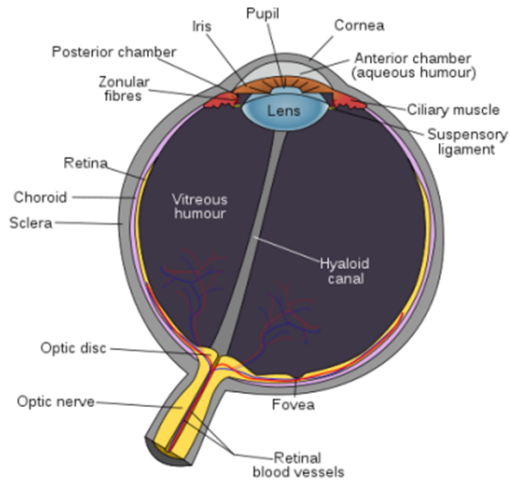


# Human Eye



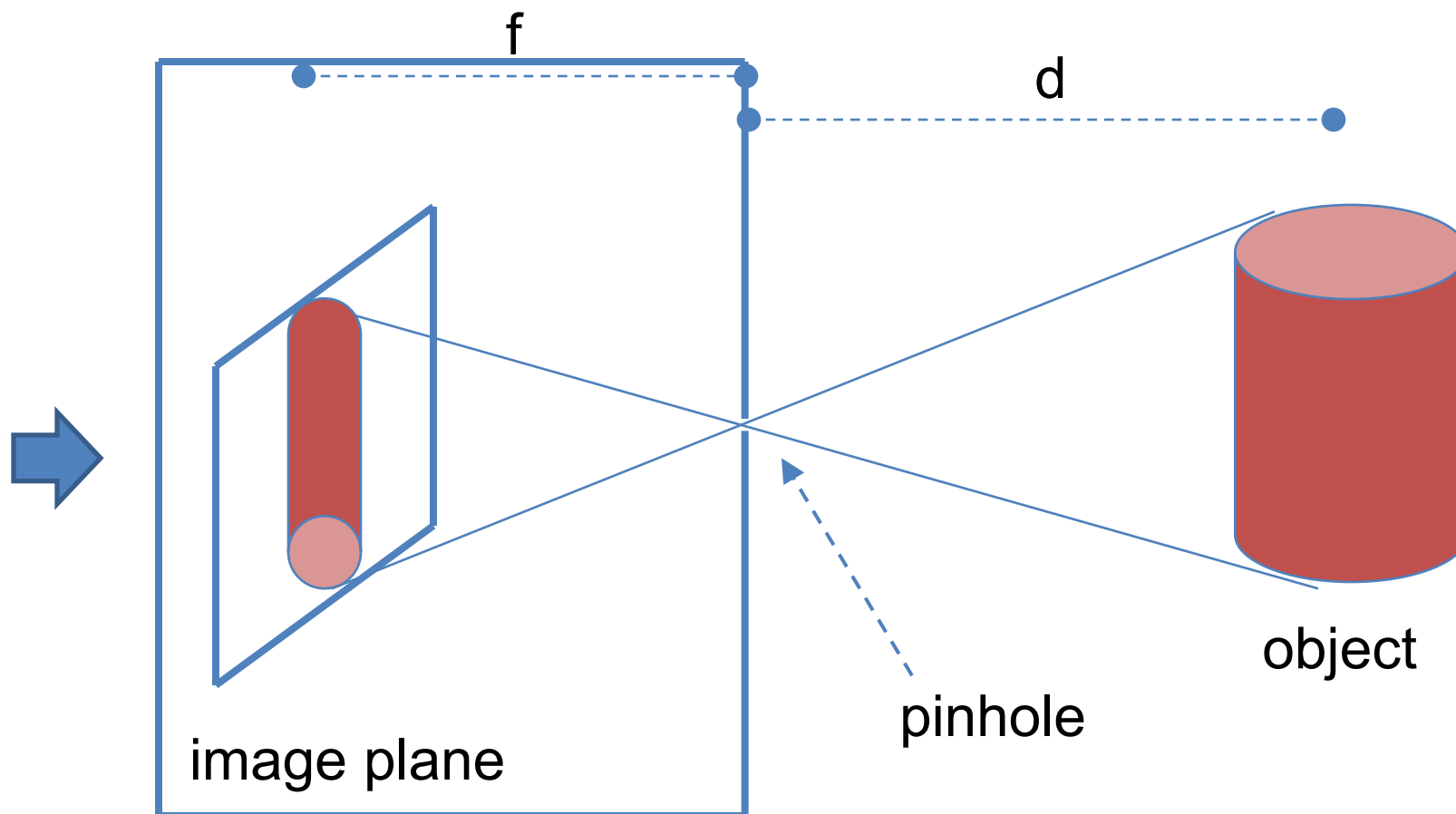


# Thin Lens System





# Pinhole Camera Model

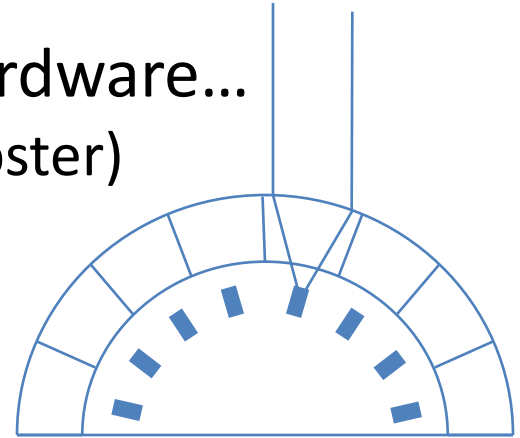




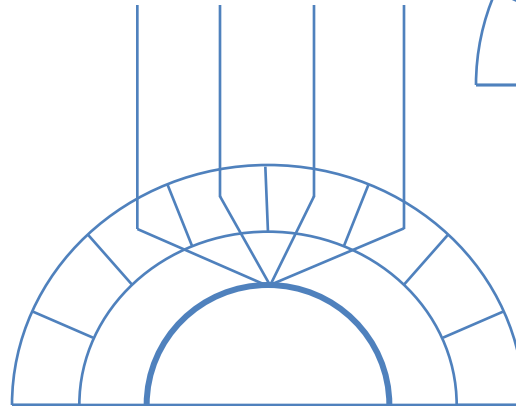
# Biology 101

- Not all animals have the same vision hardware...
  - e.g., certain insects, crustaceans (e.g., lobster)

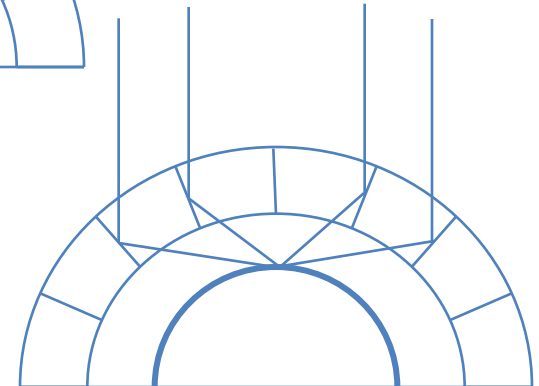
- Diurnal Insect Vision



- Nocturnal Insect Vision



- Crustacean Vision





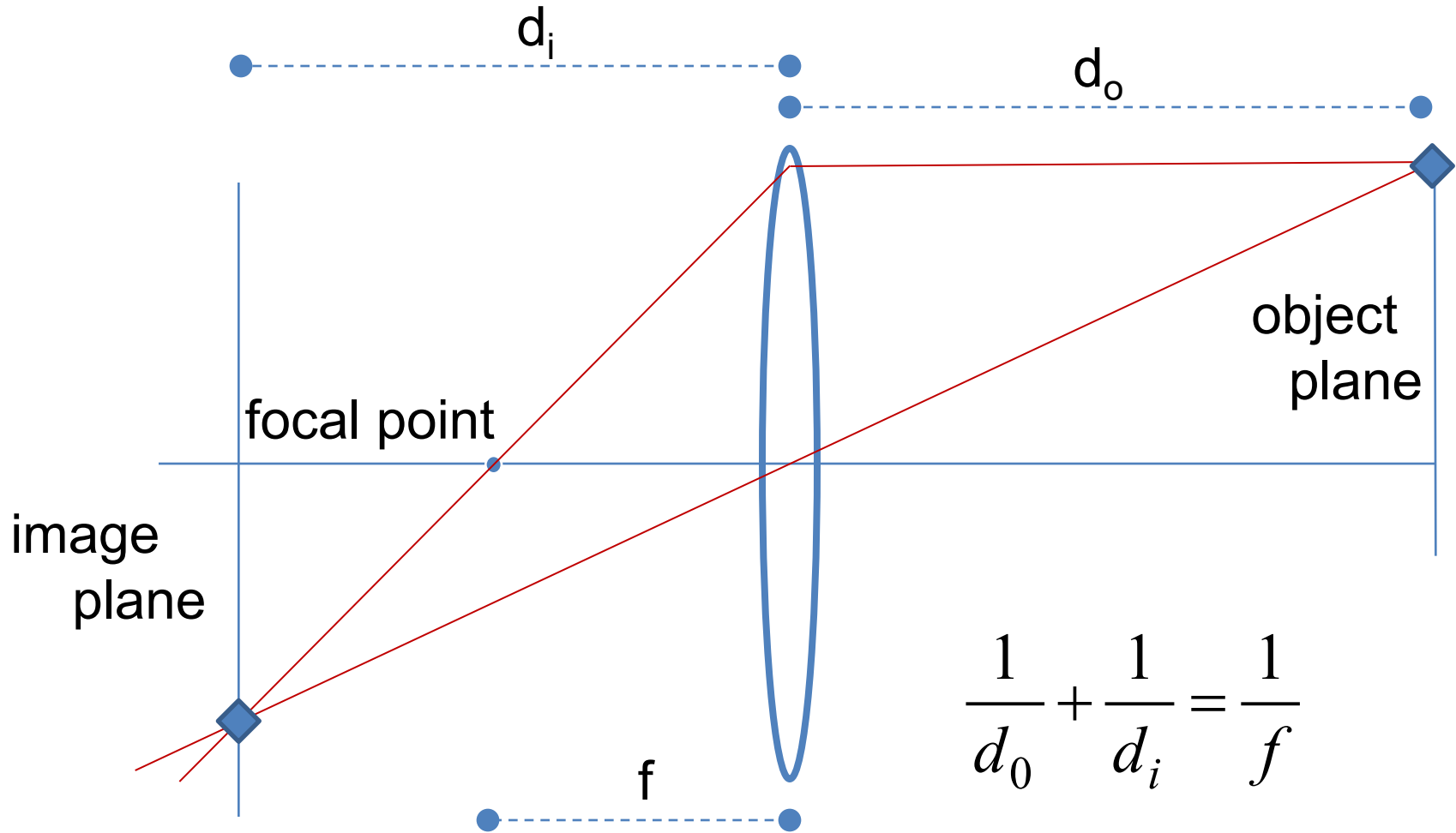
# Optics: Terminology

- Dioptric
  - All elements are refractive (lenses)
- Catoptric
  - All elements are reflective (mirrors)
- Catadioptric
  - Elements are refractive and reflective (mirrors + lenses)





# Thin Lens Equation



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



# Thin Lens Equation

- What happens if image plane is not at the focal point (distance)?



# Digression: Deblurring





# Digression: Deblurring



original image



observed image



proposed method  
25.69dB, 1.65sec



deconvwnr  
22.47dB, 0.12sec



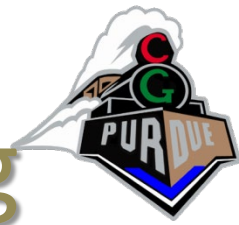
deconvlucy  
23.91dB, 6.38sec



deconvreg  
24.11dB, 0.5sec

[Chan et al., IEEE IP 2011]

# Digression: Synthetic Focusing



- Ray tracing:



- Lightfield:

- [http://lightfield.stanford.edu/aperture.swf?lightfield=data/chess\\_lf/preview.zip&zoom=1](http://lightfield.stanford.edu/aperture.swf?lightfield=data/chess_lf/preview.zip&zoom=1)

- Lytro Camera:

- [http://lightfield.stanford.edu/aperture.swf?lightfield=data/chess\\_lf/preview.zip&zoom=1](http://lightfield.stanford.edu/aperture.swf?lightfield=data/chess_lf/preview.zip&zoom=1)



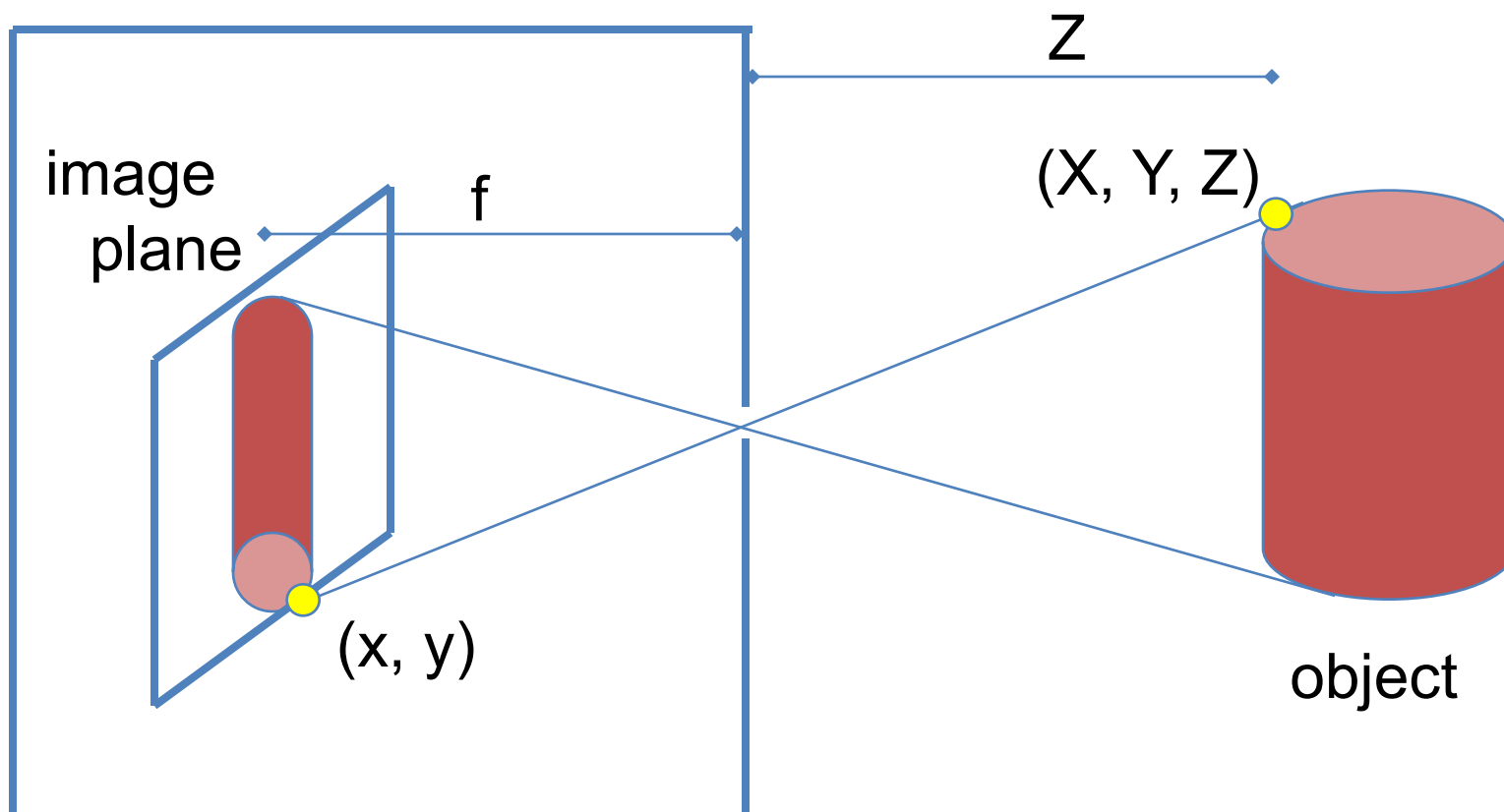
# Digression: Non-Pinhole Camera Models...

- Why restrict the camera to a pinhole camera model?
  - Aperture is large: lightfields/lumigraphs
  - Multi-perspective imaging
  - Sample-based camera
  - Tailored camera designs
    - Occlusion-resistant cameras (kinda...)
    - Graph cameras
    - and more!

**[switch to non-standard...]**



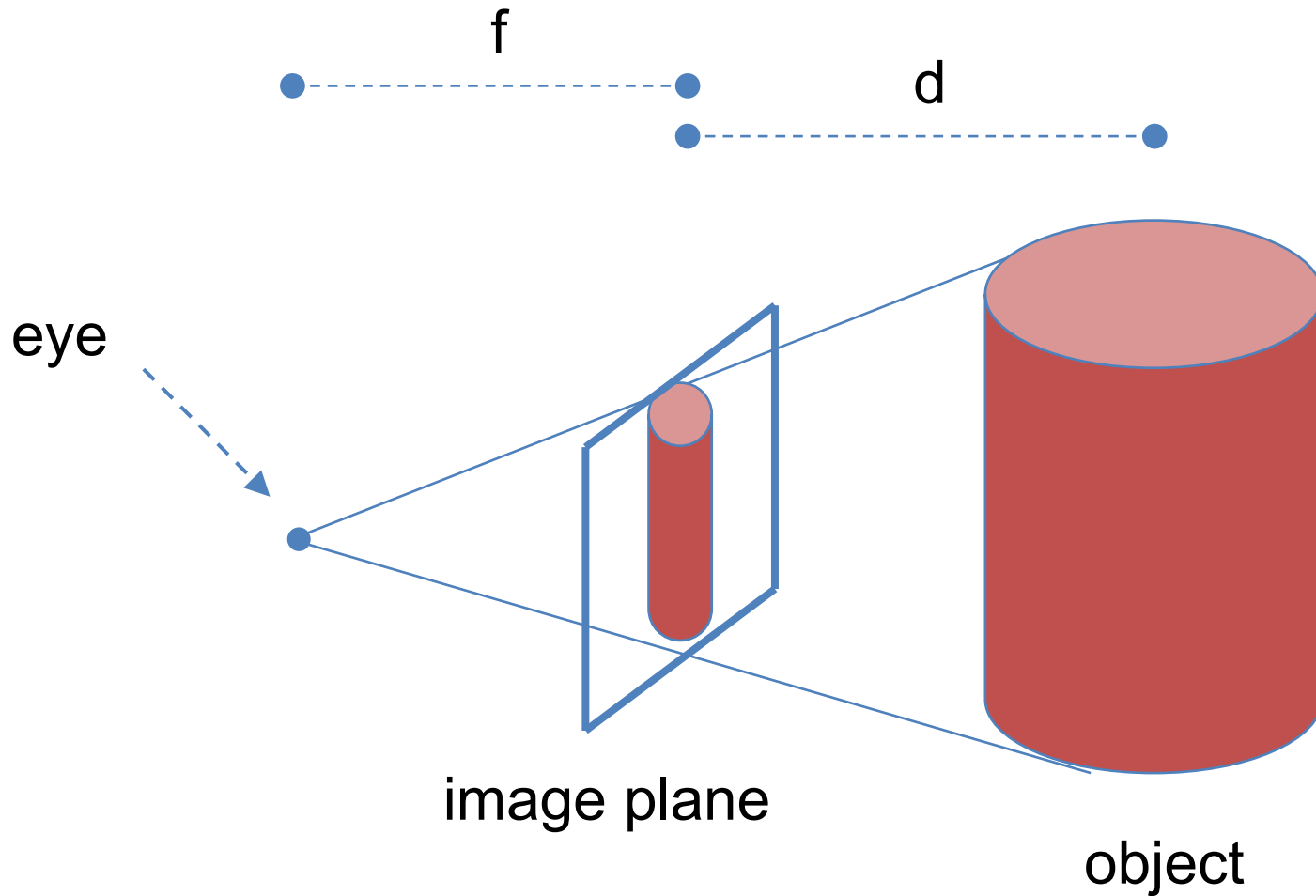
# Pinhole Camera Model



$$x = f \frac{X}{Z}$$

$$y = f \frac{Y}{Z}$$

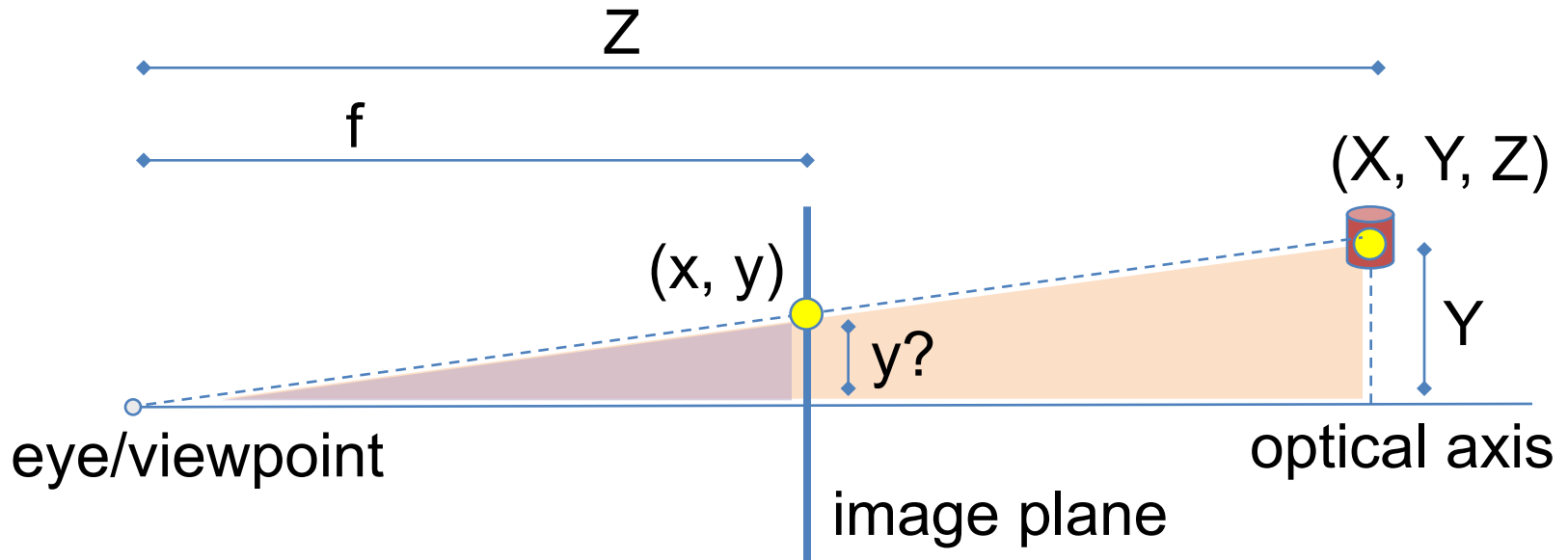
# “Computer Graphics” Pinhole Camera Model







# 3D Perspective Projection

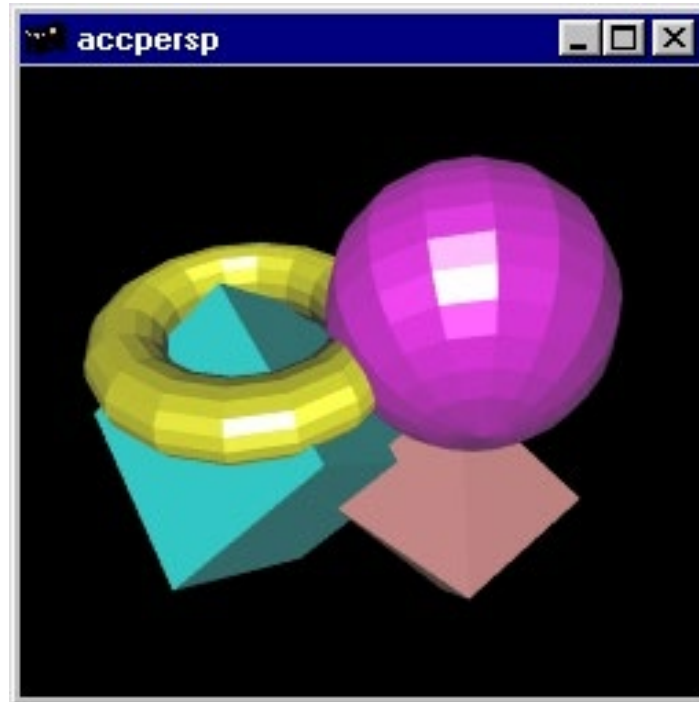


$$\frac{y}{f} = \frac{Y}{\bar{Z}}$$



$$y = f \frac{Y}{\bar{Z}} \quad \& \quad x = f \frac{X}{\bar{Z}}$$

# Example OpenGL Rendering



- Perspective is “mathematically” accurate...



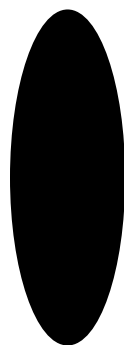
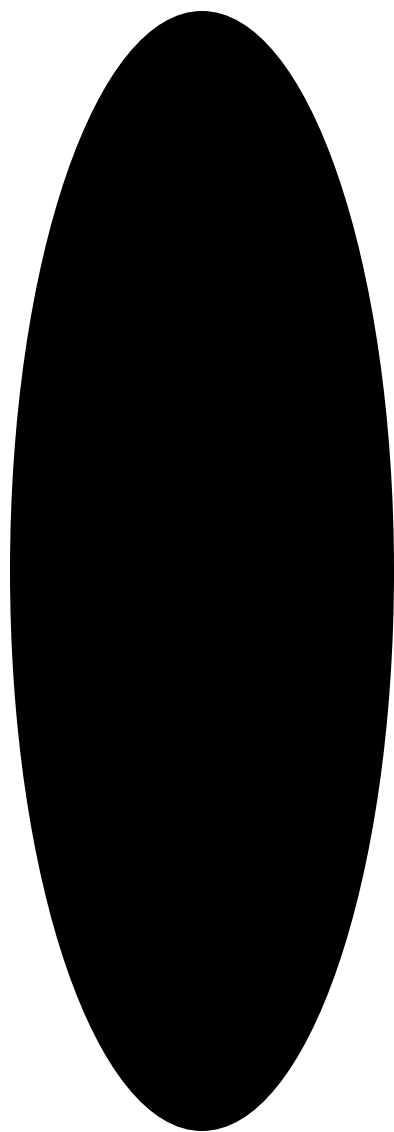
# (3D) Perception

- There is lot more to it...



# Perception

- Size-distance relationship
  - Same size object at two distances...

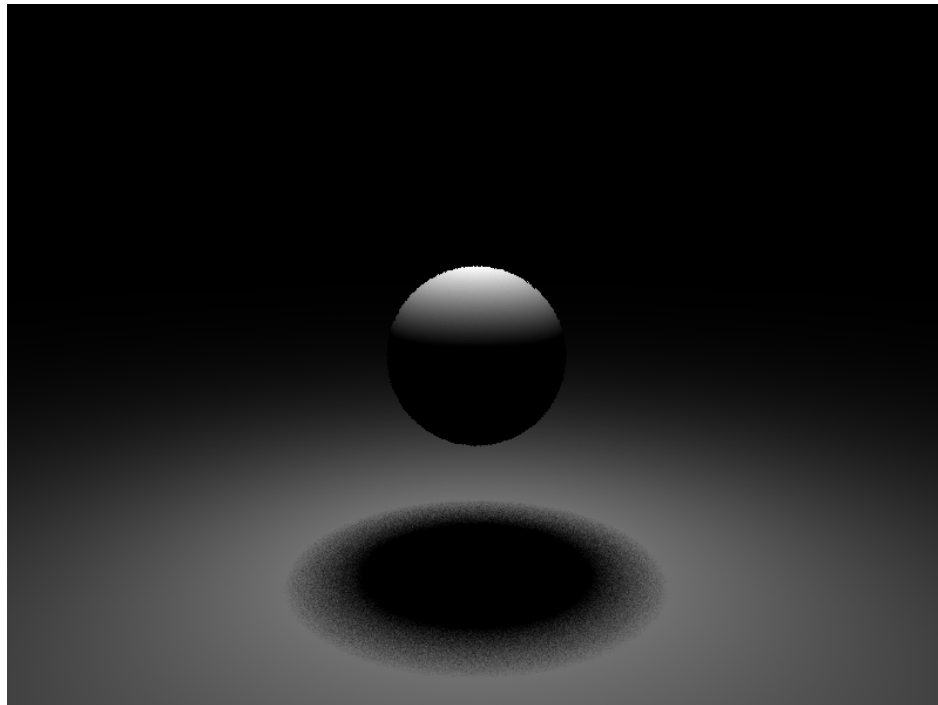






# Perception

- Importance of ground plane, shadows...





# Perception

- Alto Relief



- Sunken Relief

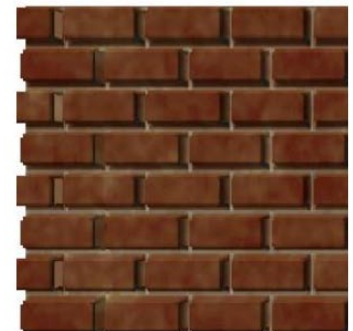
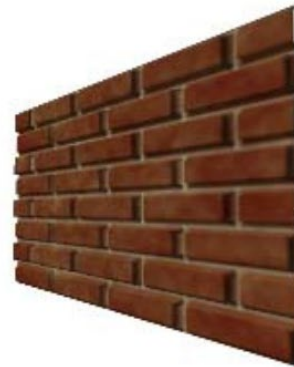
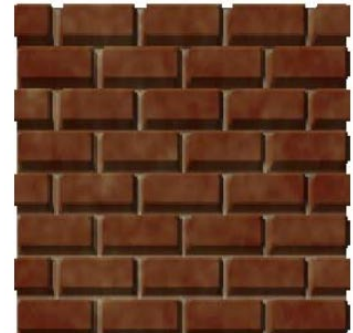
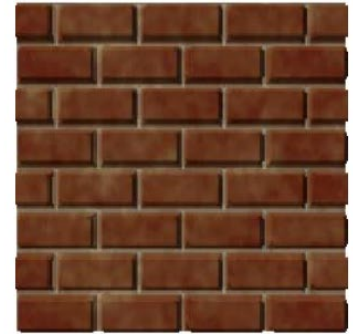
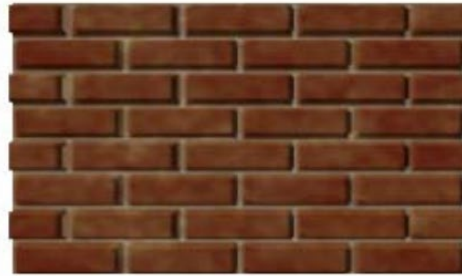




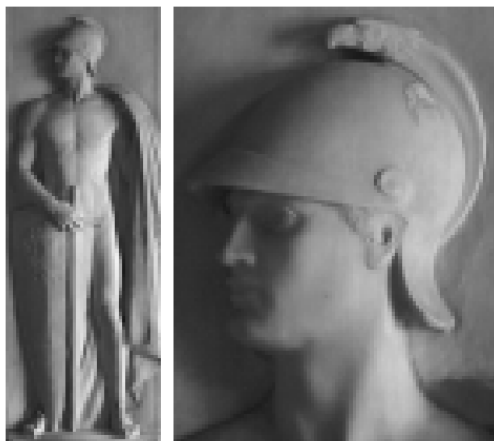


# (Relief Images)

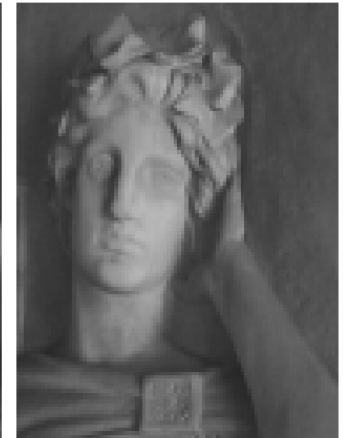
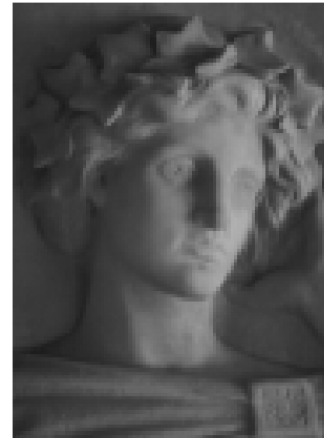
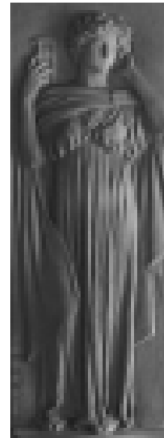
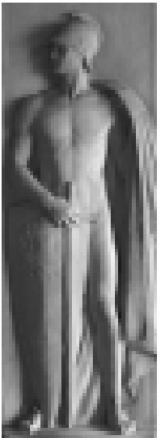
- We will see this type of things later...



# Perception: Bas-Relief



# Perception: Bas-Relief





# Perception: Bas Relief Ambiguity

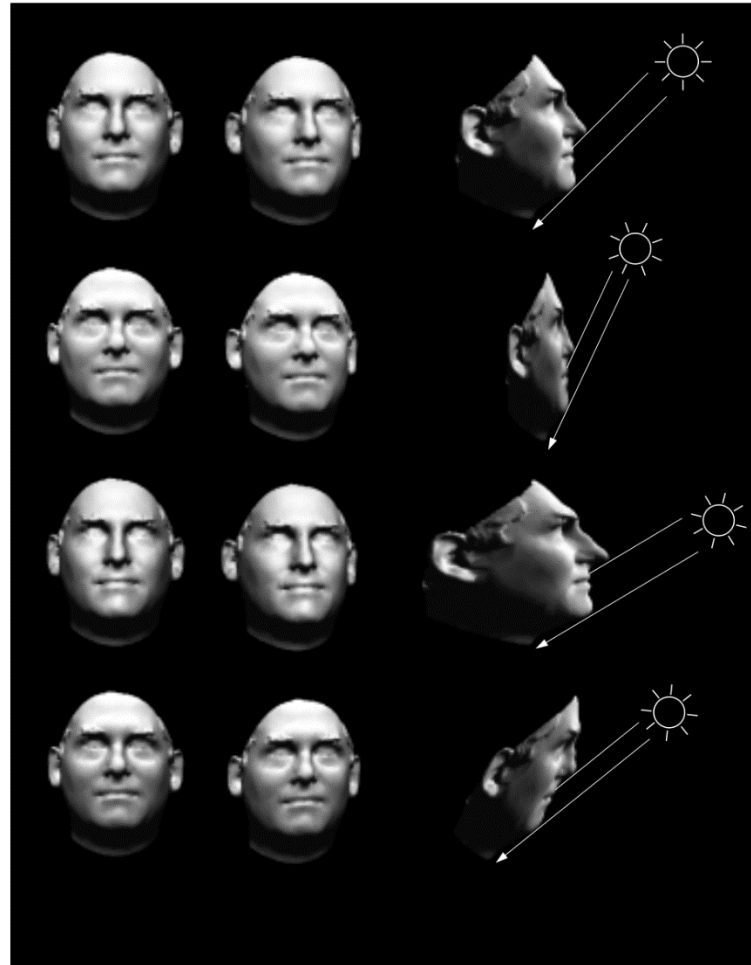
$$NL^T = C$$

or

$$NRR^T L^T = C$$

$$NGG^{-1} L^T = C$$

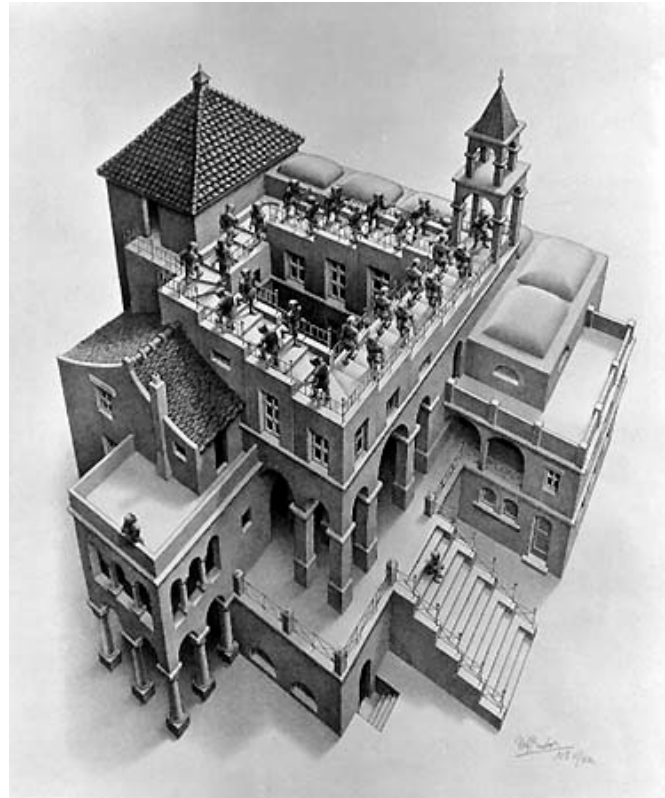
??



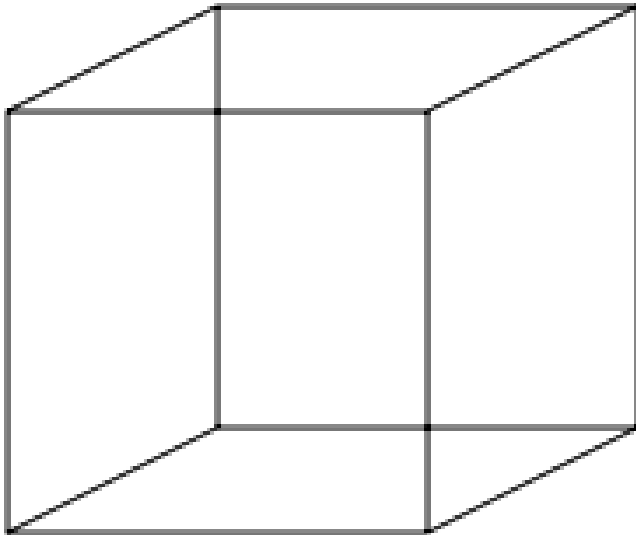
# Perception: Inconsistencies



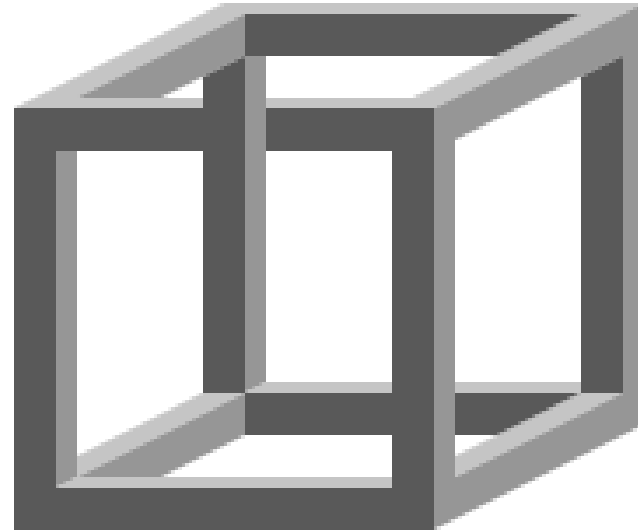
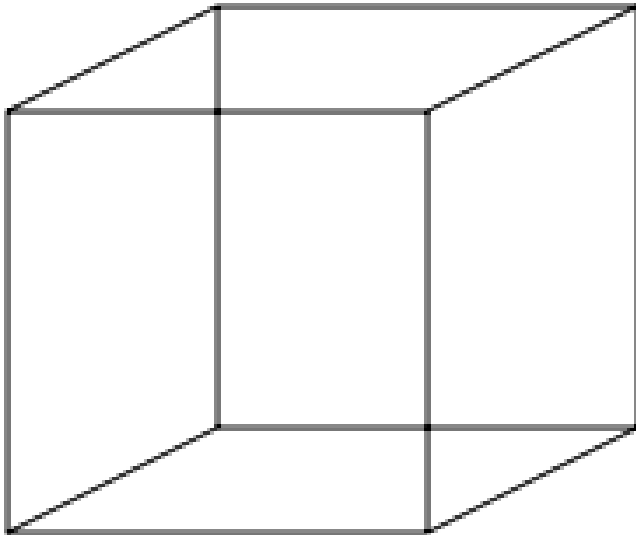
- Escher



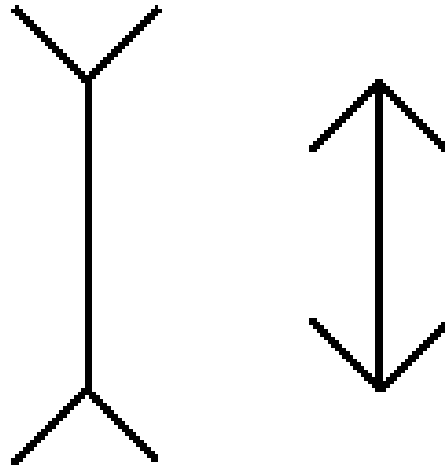
# Perception: Necker Cube



# Perception: Necker Cube

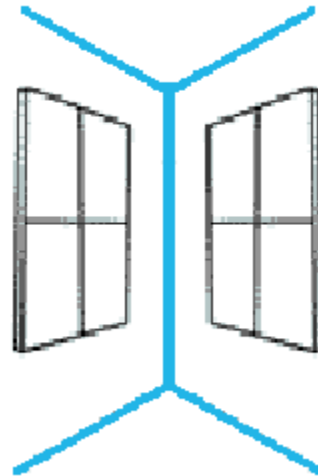


# Perception: Muller-Lyer Illusion

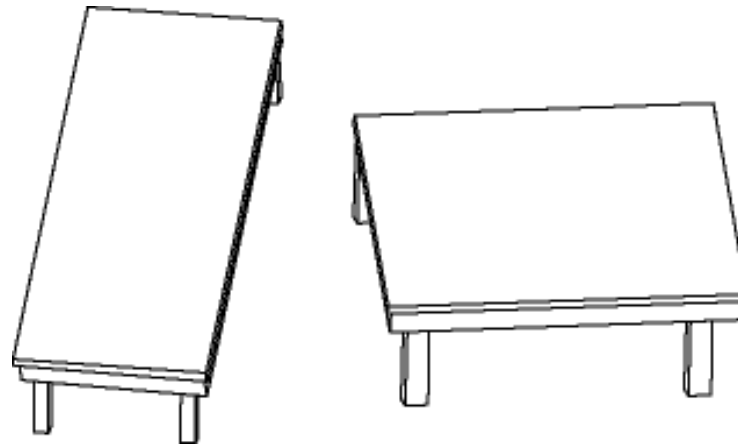




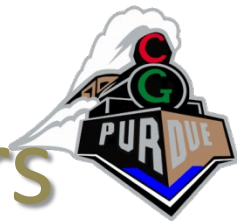
# Perception: Muller-Lyer Illusion



# Perception: Muller-Lyer Illusion



# Perspective Camera Parameters



- Intrinsic/Internal

- Focal length

$$f$$

- Principal point (center)

$$p_x, p_y$$

- Pixel size

$$s_x, s_y$$

- (Distortion coefficients)

$$k_1, \dots$$

- Extrinsic/External

- Rotation

$$\phi, \varphi, \psi$$

- Translation

$$t_x, t_y, t_z$$

# Perspective Camera Parameters



- Intrinsic/Internal

- Focal length

$f$

- Principal point (center)

(=middle of image)

- Pixel size

(=1, irrelevant)

- (Distortion coefficients)

(=0, assuming no bugs 😊)

- Extrinsic/External

- Rotation

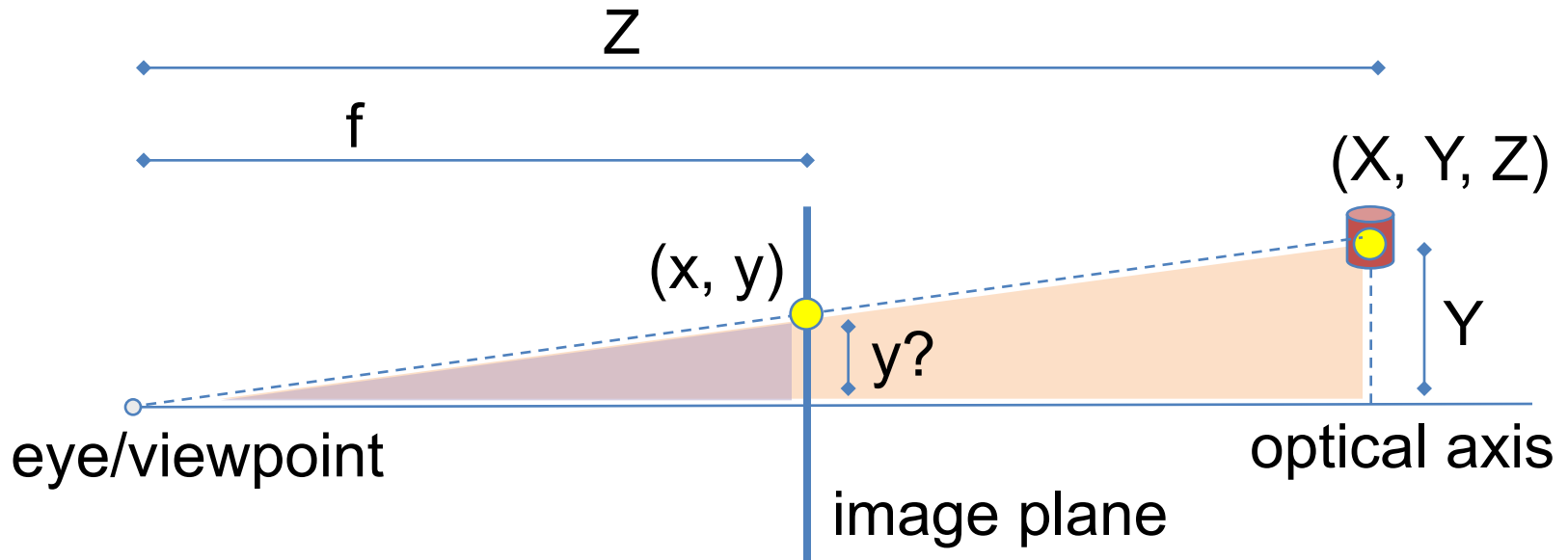
$\phi, \varphi, \psi$

- Translation

$t_x, t_y, t_z$



# Recall: 3D Perspective Projection



$$\frac{y}{f} = \frac{Y}{Z} \quad \Rightarrow \quad y = f \frac{Y}{Z} \quad \& \quad x = f \frac{X}{Z}$$

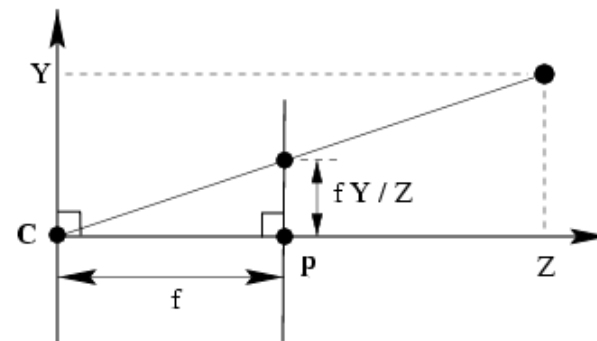
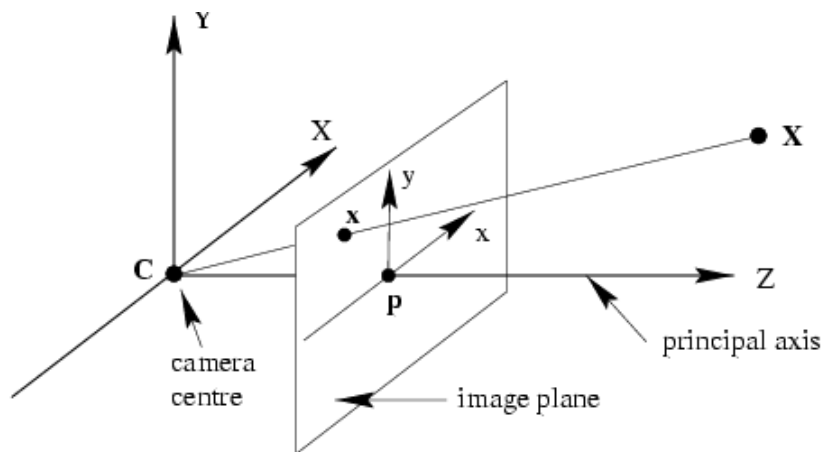


# Matrix Encoding

- How do we put the perspective divide process into the matrix pipeline?



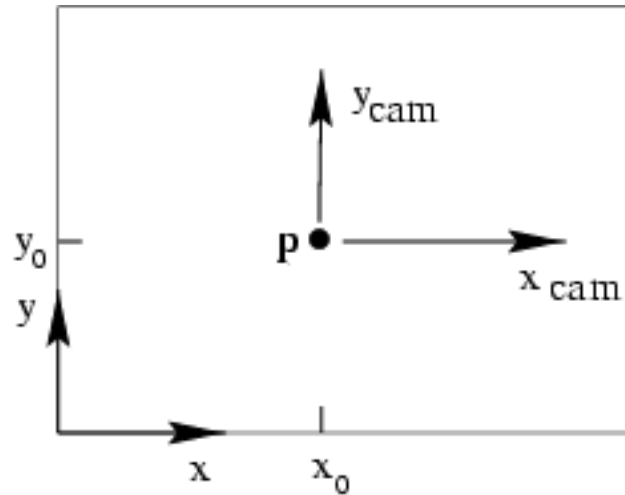
# Focal Length



$$\begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} fX/Z \\ fY/Z \end{pmatrix} \leftarrow \begin{pmatrix} fX \\ fY \\ Z \end{pmatrix} = \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$$



# Principal Point

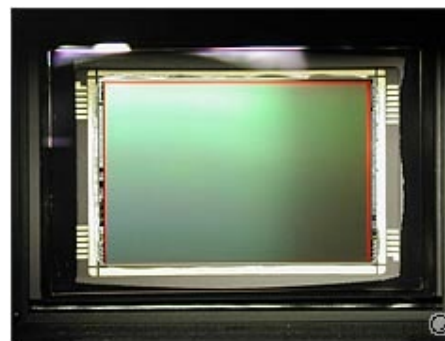


$$\begin{pmatrix} x_0 \\ y_0 \end{pmatrix} \leftarrow \begin{pmatrix} fX + Zp_x \\ fY + Zp_y \\ Z \end{pmatrix} = \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix}$$





# CCD Camera: Pixel Size



$$P = \begin{bmatrix} f & 0 & p_x & 0 \\ 0 & f & p_y & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

In graphics, often

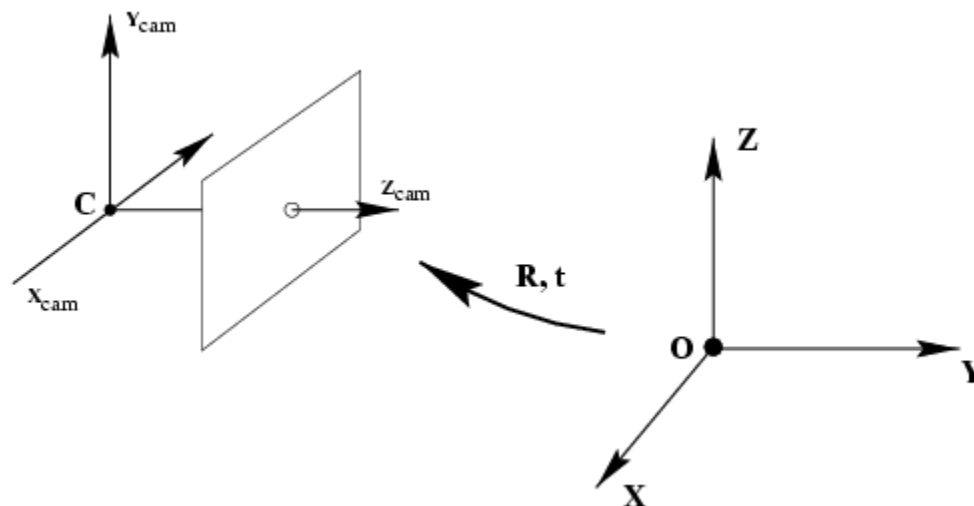
$$\begin{aligned} s_x &= s_y = 1 \\ p_x &= p_y = 0 \end{aligned}$$

$$P = \begin{bmatrix} \alpha_x & 0 & p_x & 0 \\ 0 & \alpha_y & p_y & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

Projection matrix



# Translation & Rotation



$$\left. \begin{aligned} \tilde{x}_c &= R(\tilde{X} - C) \\ \tilde{x}_c &= R\tilde{X} - RC \\ &\quad \downarrow \\ &\quad -t \end{aligned} \right\} \tilde{x}_c = \begin{bmatrix} R & t \\ 0 & 1 \end{bmatrix} \begin{pmatrix} X \\ Y \\ Z \\ 1 \end{pmatrix}$$

$$R = R_x R_y R_z$$

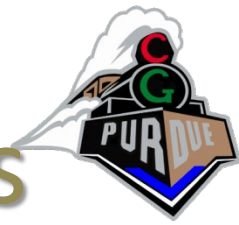
3x3 rotation matrices

$$t = \begin{bmatrix} t_x & t_y & t_z \end{bmatrix}^T$$

translation vector

World-to-camera matrix  $M$

# Perspective Projection Process



- Given  $\tilde{X} = \begin{pmatrix} X \\ Y \\ Z \\ 1 \end{pmatrix}$

...the perspective projection is

$$\tilde{x}_p = PM \begin{pmatrix} X \\ Y \\ Z \\ 1 \end{pmatrix} \longrightarrow \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} \tilde{x}_{p_x} / \tilde{x}_{p_z} \\ \tilde{x}_{p_y} / \tilde{x}_{p_z} \end{bmatrix}$$



# Projection Matrices

- Basic Perspective Projection:

$$\begin{bmatrix} f & 0 & 0 \\ 0 & f & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

- Basic Orthographic:

$$\begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$



# 4x4 Matrices

- How do we encode into 4x4 matrix/vector multiplication pipeline?
- See black board...



# Projection Matrices

- Passthrough Z Perspective Projection:

$$\begin{bmatrix} n & 0 & 0 & 0 \\ 0 & n & 0 & 0 \\ 0 & 0 & n + f & -nf \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

If ( $Z = n$ ), then  $z = \left( n + f - \frac{nf}{n} \right) = n$

If ( $Z = f$ ), then  $z = \left( n + f - \frac{nf}{f} \right) = f$



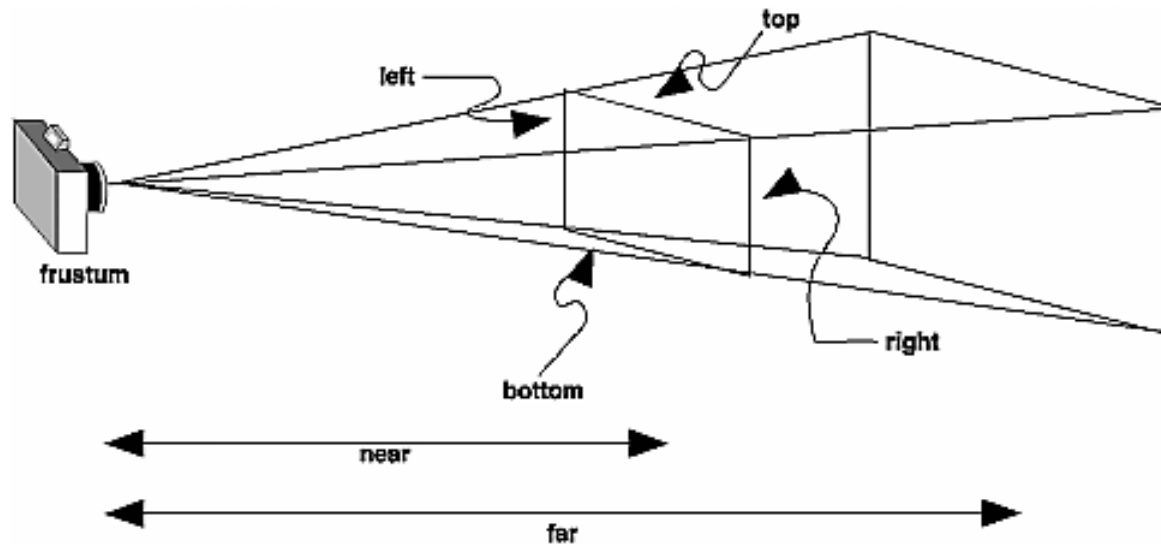
# Projection Matrices

- To map  $[-1,+1]$  to viewing frustum  $(l,r,b,t,n,f)$ :

$$\begin{bmatrix} 2n/(r-l) & 0 & 0 & -(r+l)/(r-l) \\ 0 & 2n/(t-b) & 0 & -(t+b)/(t-b) \\ 0 & 0 & 2n/(n-f) & -(n+f)/(n+f) \\ 0 & 0 & 0 & 1 \end{bmatrix}$$



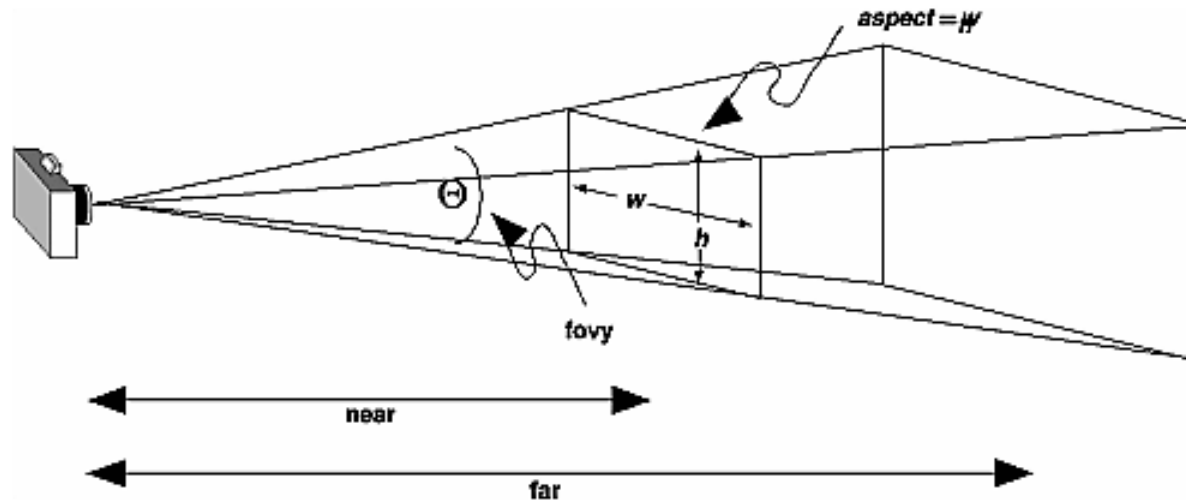
# Projection Transformations



```
void glFrustum(GLdouble left, GLdouble right, GLdouble  
bottom, GLdouble top, GLdouble near, GLdouble far);
```



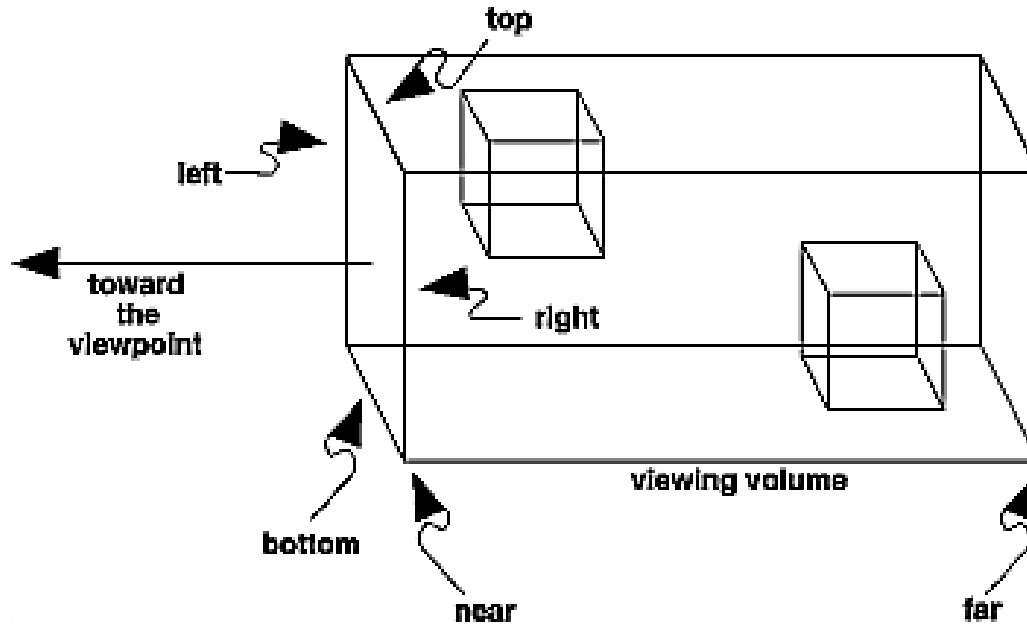
# Projection Transformations



```
void gluPerspective(GLdouble fovy, GLdouble aspect, GLdouble  
near, GLdouble far);
```



# Projection Transformations



```
void glOrtho(GLdouble left, GLdouble right, GLdouble  
             bottom,  
             GLdouble top, GLdouble near, GLdouble far);
```

```
void gluOrtho2D(GLdouble left, GLdouble right,  
               GLdouble bottom, GLdouble top);
```



# OpenGL Equivalent

```
...  
glMatrixMode(GL_PROJECTION);  
...  
gluPerspective(60, 1.0, 0.1, 1000.0);  
...  
glMatrixMode(GL_MODELVIEW);  
...  
glTranslatef(tx, ty, tz);  
glRotatef(rx, 1, 0, 0);  
glRotatef(ry, 0, 1, 0);  
glRotatef(rz, 0, 0, 1);  
  
/* or glLoadMatrixf(mat); */  
...
```



# OpenGL Note

- OpenGL is row major and left-multiplies
- This means from the previous (more intuitive explanation) the actual matrix is the transpose of what I wrote; e.g.  $M_{OpenGL} = M^T$
- Also, the order of multiplication is from most recent matrix command to least recent matrix command; e.g.
  - “glRotate(rx,1,0,0); glRotate(ry,0,1,0)” rotates a vertex about the y-axis and then the x-axis

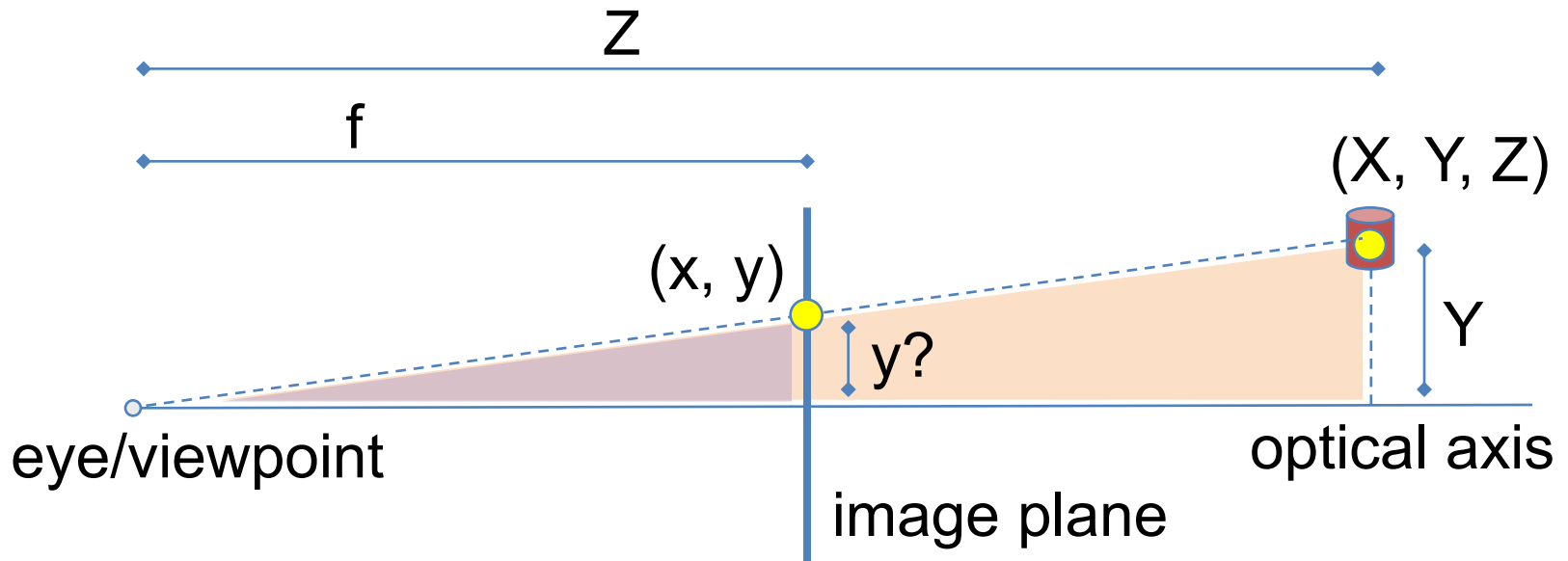


# Producing a 3D World

- Camera
  - **Zero lens model (i.e., no lens)**
  - Thin lens model
  - Thick lens model



# (Zero Lens) Perspective Projection



$$\frac{y}{f} = \frac{Y}{Z}$$



$$y = f \frac{Y}{Z} \quad \& \quad x = f \frac{X}{Z}$$

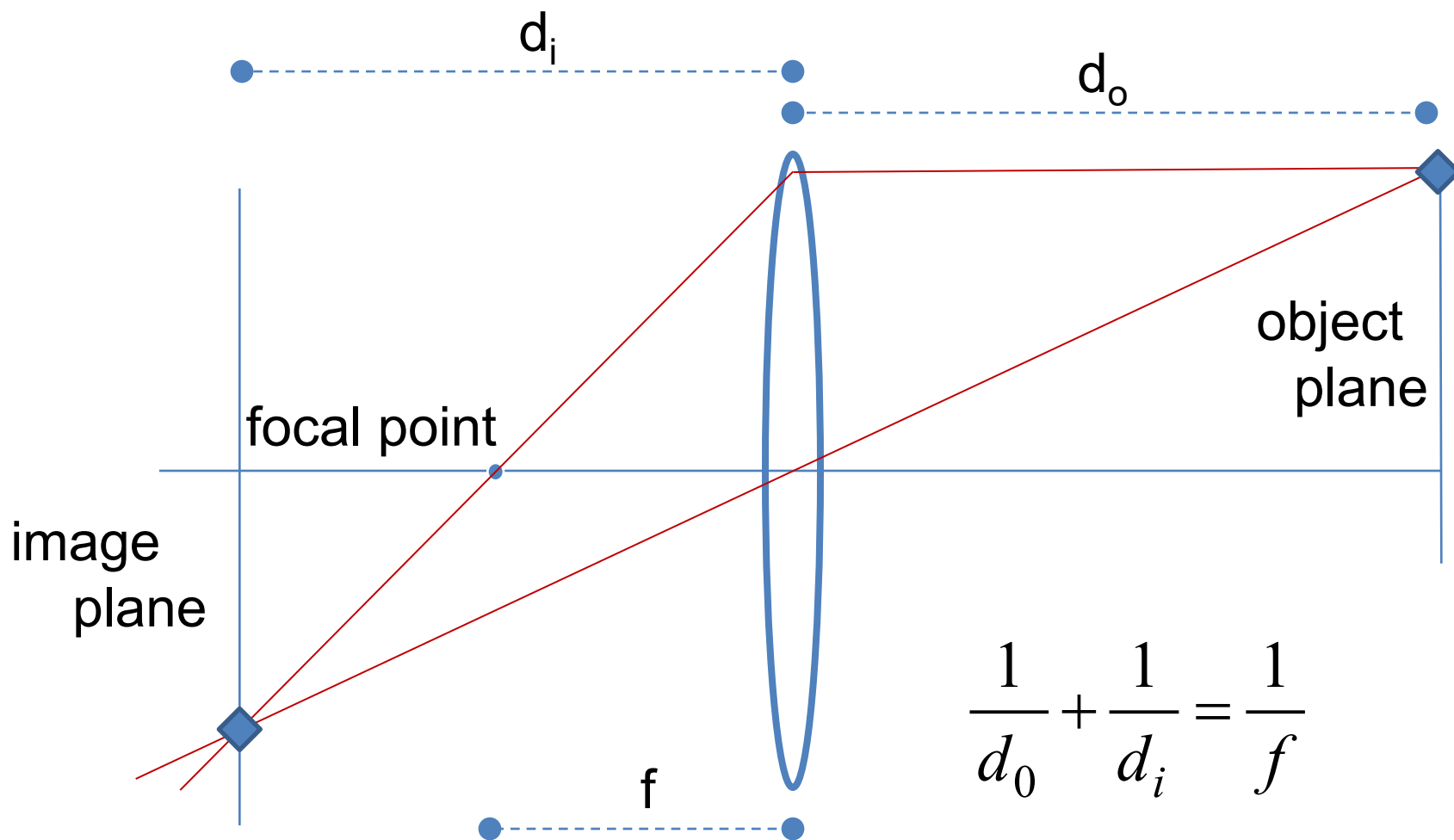


# Producing a 3D World

- Camera
  - Zero lens model (i.e., no lens)
  - **Thin lens model**
  - Thick lens model



# Thin Lens Camera Model



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





# Lens Aberrations

- A “real” lens system does not produce a perfect image
- Aberrations are caused by imperfect manufacturing and by our approximate models
  - Lenses typically have a spherical surface
    - Aspherical lenses would better compensate for refraction but are more difficult to manufacture
  - Typically 1<sup>st</sup> order approximations are used
    - Remember  $\sin \Omega = \Omega - \Omega^3/3! + \Omega^5/5! - \dots$
    - Thus, thin-lens equations only valid iff  $\sin \Omega \approx \Omega$



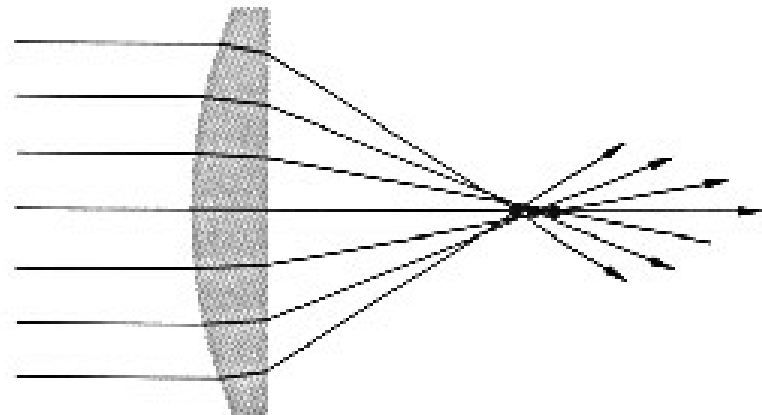
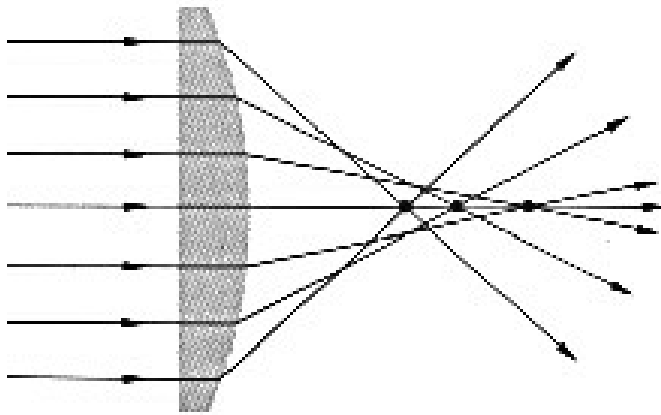
# Aberrations

- Most common aberrations:
  - Spherical aberration
  - Coma
  - Astigmatism
  - Curvature of field
  - Chromatic aberration
  - **Distortion**



# Spherical Aberration

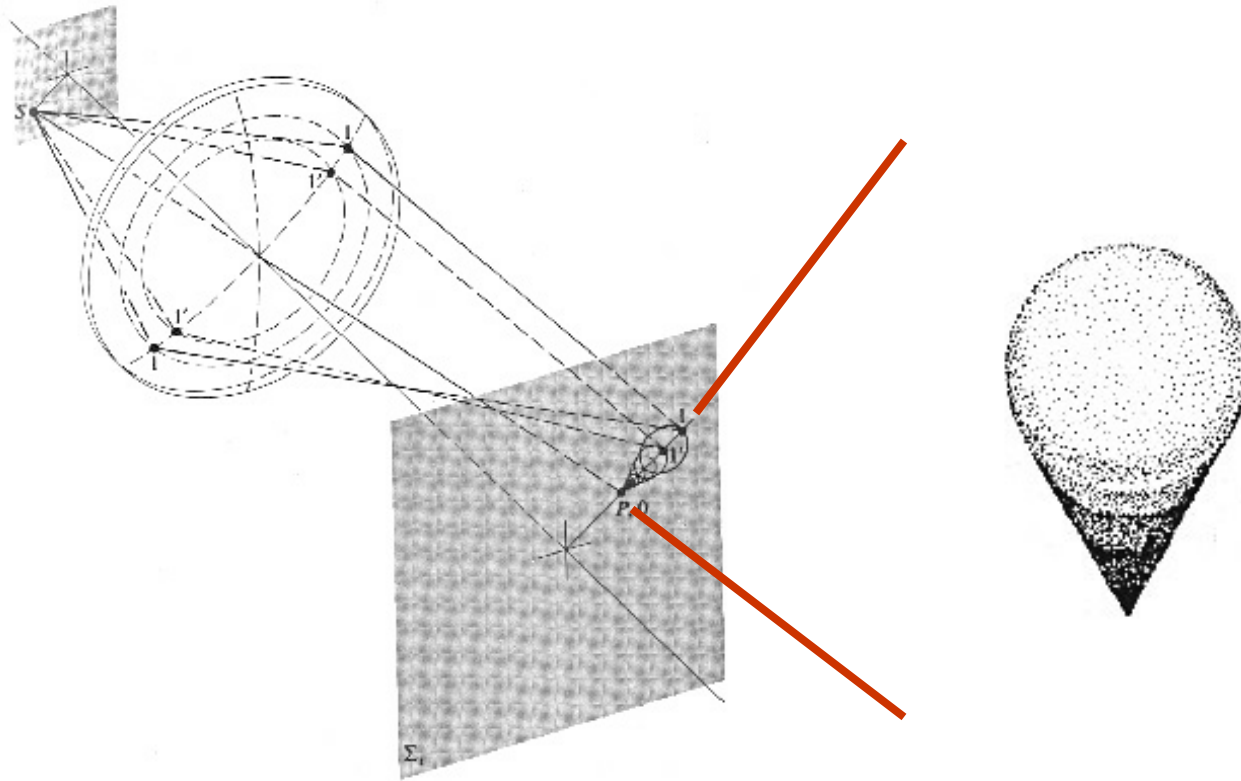
- Deteriorates axial image





# Coma

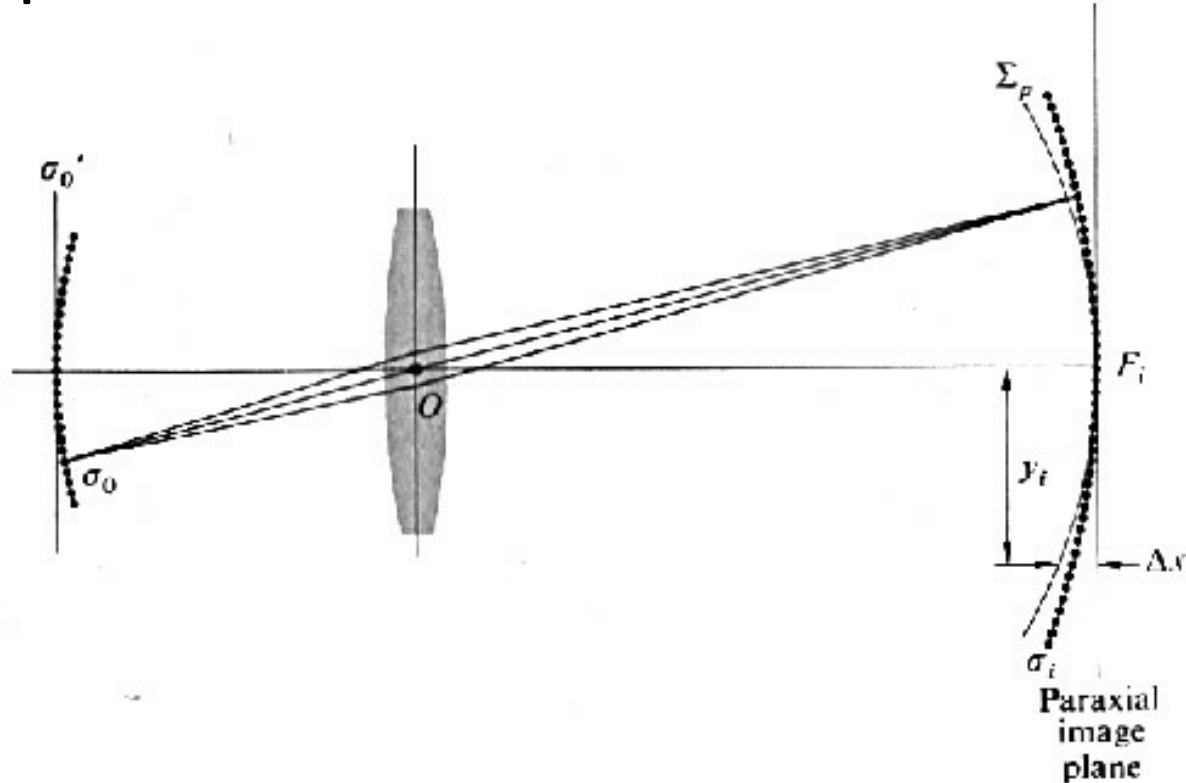
- Deteriorates off-axial bundles of rays





# Astigmatism and Curvature of Field

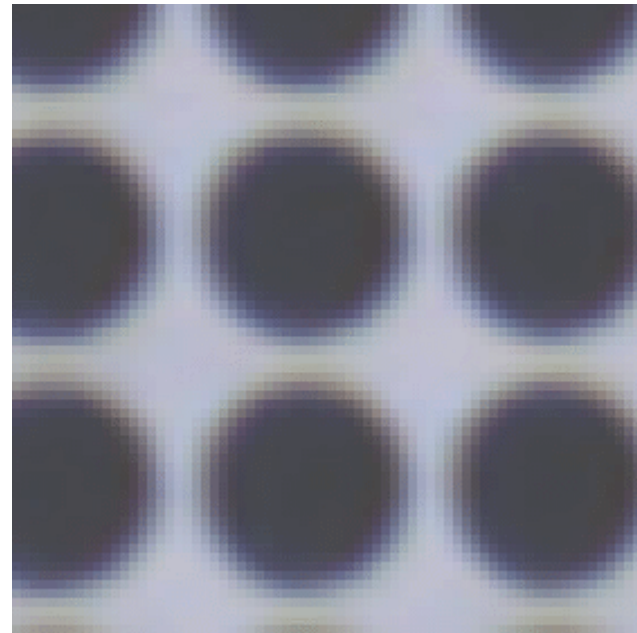
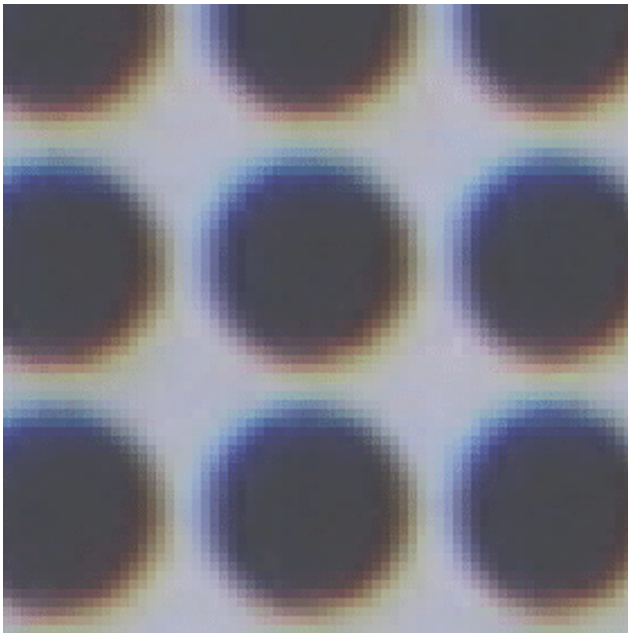
- Produces multiple (two) images of a single object point





# Chromatic Aberration

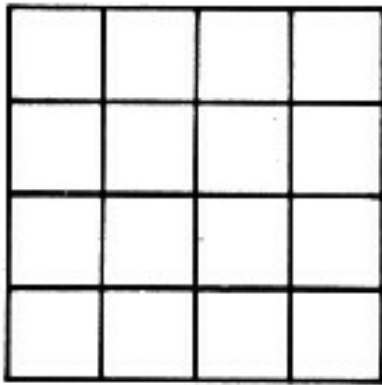
- Caused by wavelength dependent refraction
  - Apochromatic lenses (e.g., RGB) can help



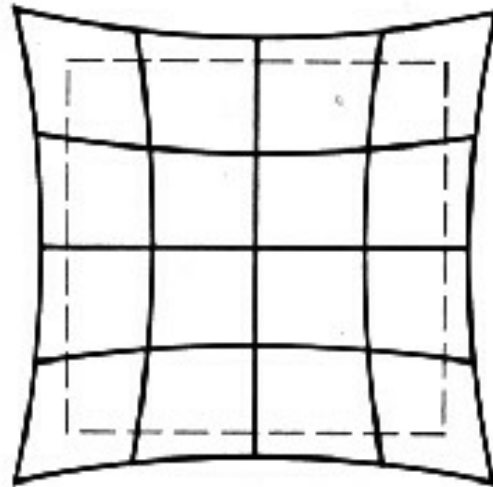


# Distortion

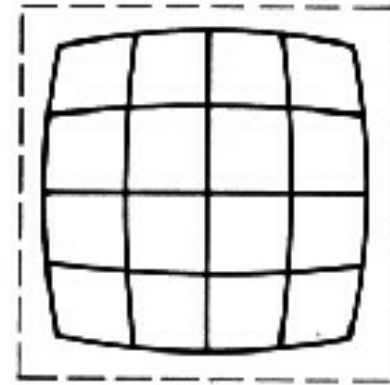
- Radial (and tangential) image distortions



Orthoscopic



Pin-cushion  
distortion



Barrel  
distortion



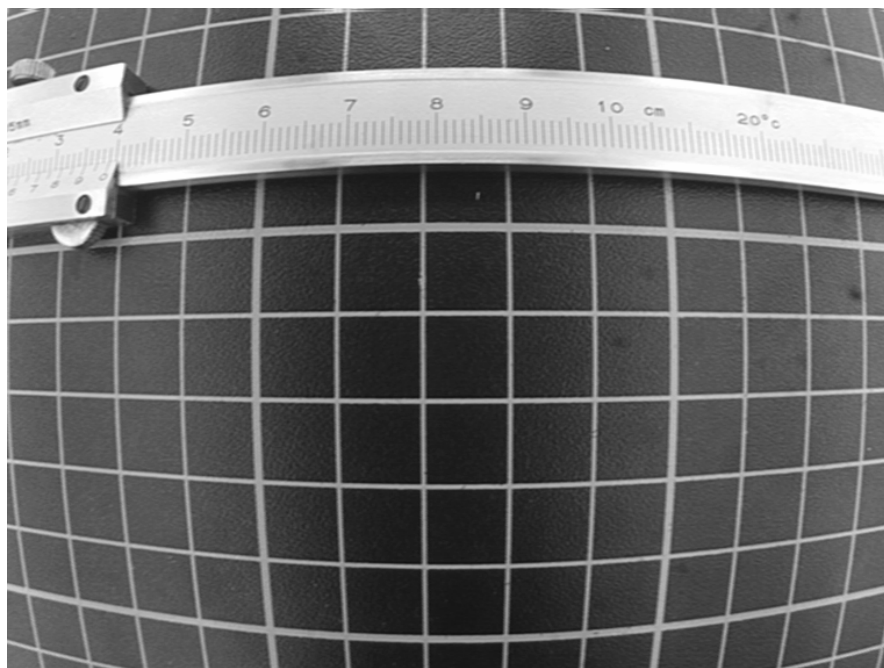
# Radial Distortion

- $(x, y)$  pixel before distortion correction
- $(x', y')$  pixel after distortion correction
- Let  $r = (x^2 + y^2)^{-1}$
- Then
  - $x' = x(1 - \Delta r/r)$
  - $y' = y(1 - \Delta r/r)$
  - where  $\Delta r = k_0r + k_1r^3 + k_2r^5 + \dots$
- Finally,
  - $x' = x(1 - k_0 - k_1r^2 - k_2r^4 - \dots)$
  - $y' = y(1 - k_0 - k_1r^2 - k_2r^4 - \dots)$

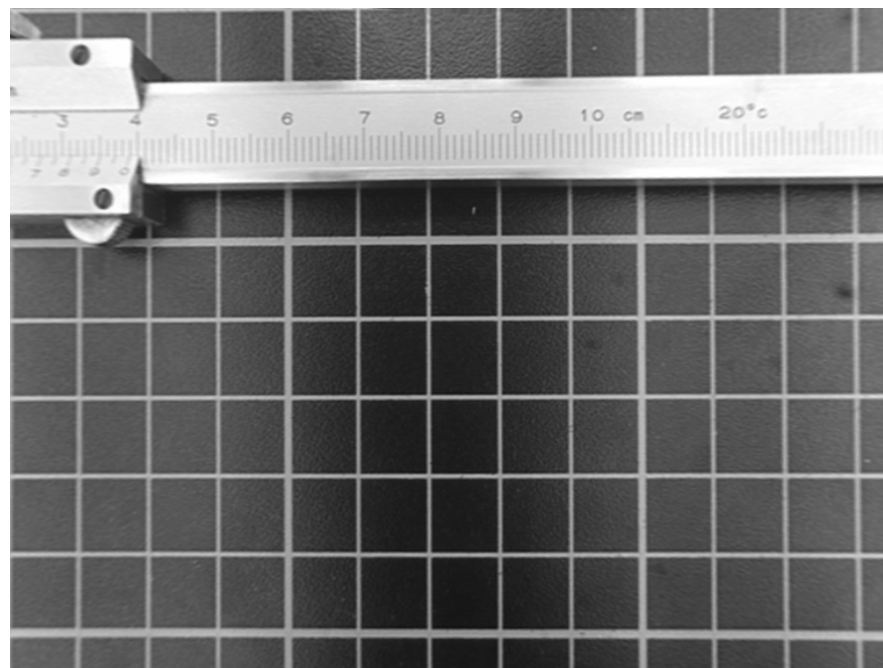




# Radial Distortion



before



after

# Tsai Camera Model and Calibration



- A widely used camera model to calibrate conventional cameras based on a pinhole camera
- Reference
  - “A Versatile Camera Calibration Technique for High-Accuracy 3D Machine Vision Metrology Using Off-the-Shelf TV Cameras and Lenses”, Roger Y. Tsai, IEEE Journal of Robotics and Automation, Vol. 3, No. 4, August 1987

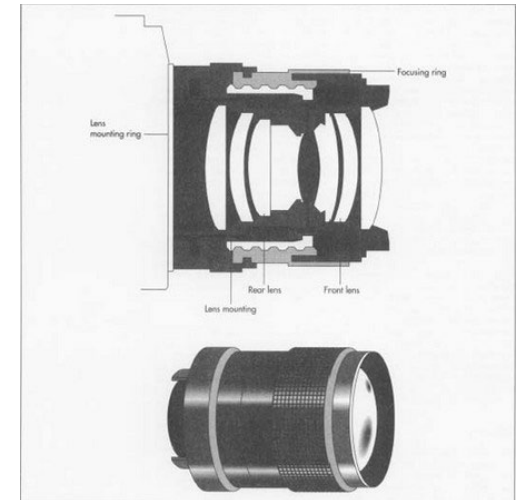
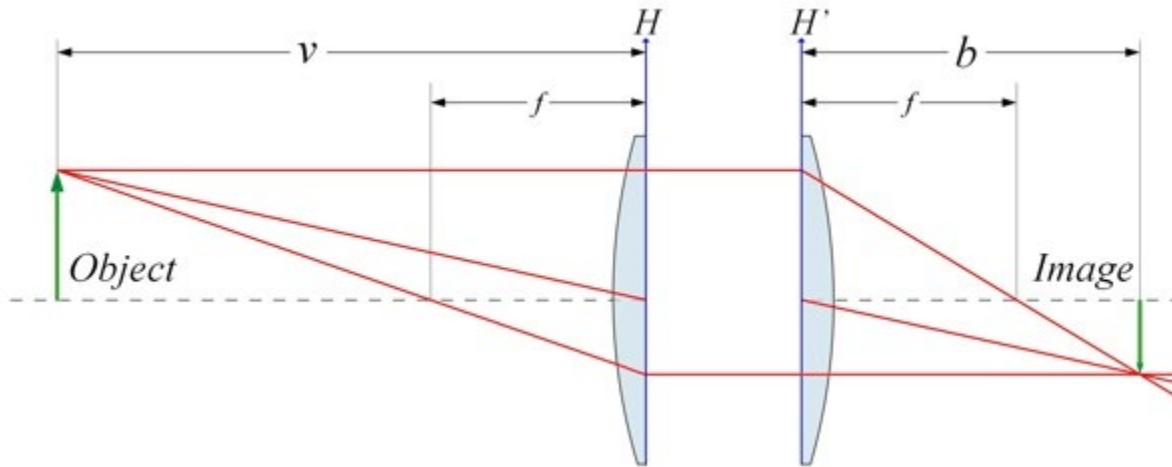


# Producing a 3D World

- Camera
  - Zero lens model (i.e., no lens)
  - Thin lens model
  - **Thick lens model**



# Thick Lens Camera Model

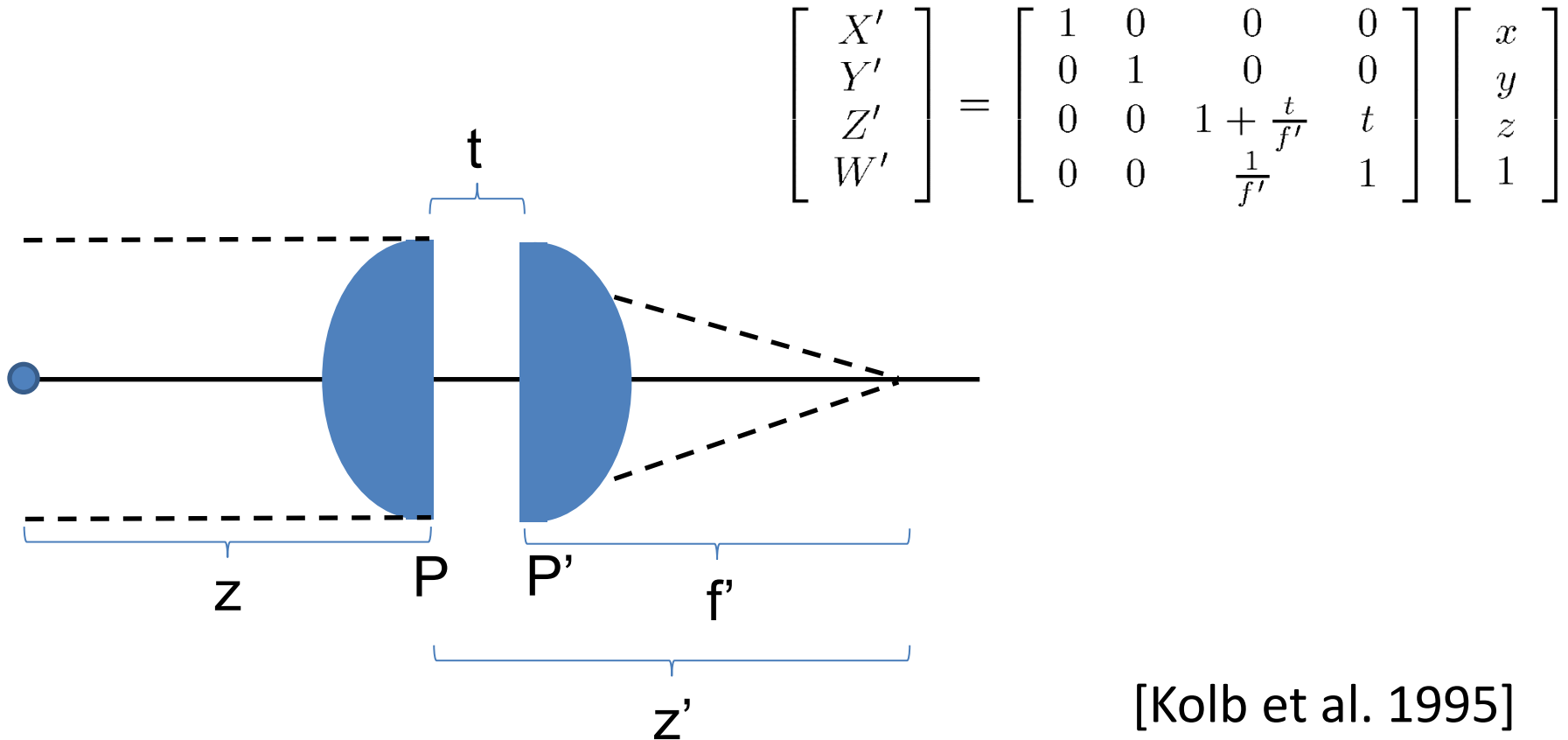


- <http://www.cabrillo.edu/~jmccullough/Applets/optics.html>
- Even more parameters...



# Thick Lens Camera Model

- A simplification for 4x4 matrix usage



[Kolb et al. 1995]