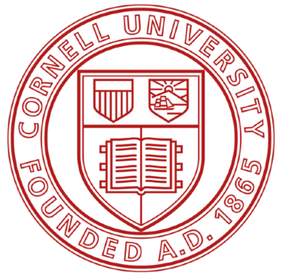
Lecture 18: Image formation

CS 5670: Introduction to Computer Vision



Most slides from Noah Snavely

Physically-based computer vision

Use physical constraints to solve perception problems.

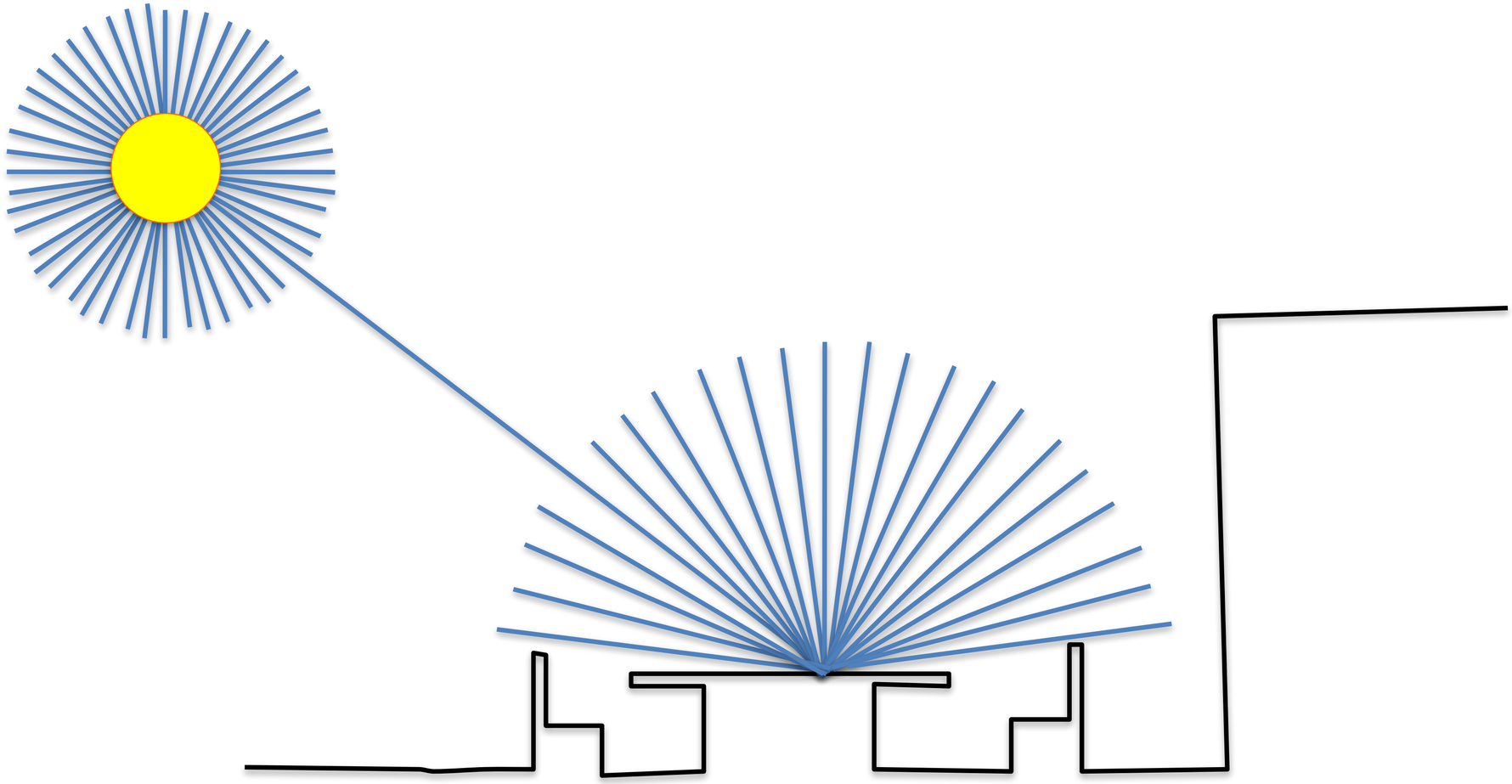
Why study this?

- Physically-based methods often (still!) outperform learned systems
- Hybrid approaches: learning methods that exploit physical constraints
- Helps us understand limitations of visual perception
- Many domains where you do not want to rely much on prior knowledge (e.g., computational imaging for astronomy)

Today

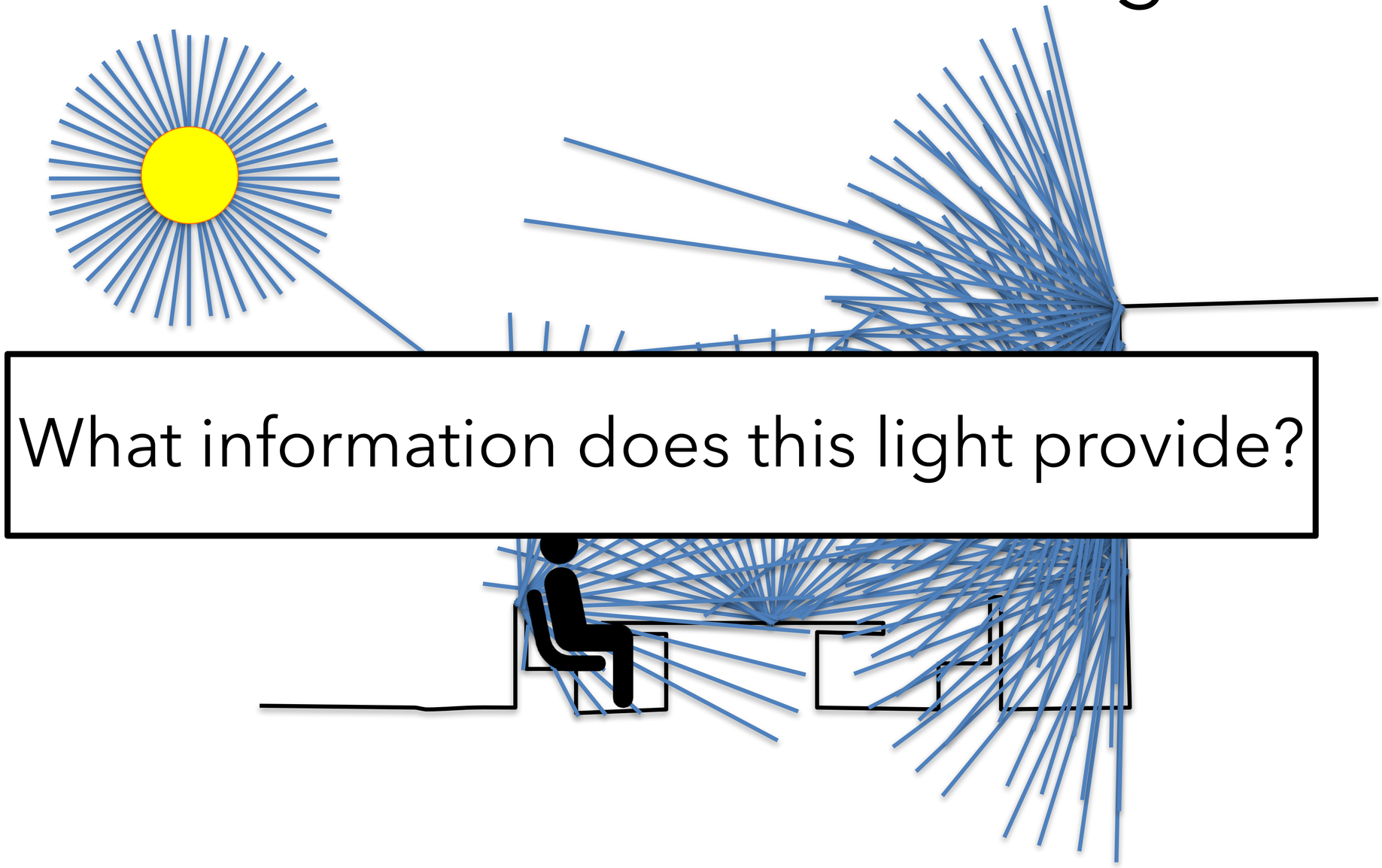
- Camera models
- Projection equations

The structure of ambient light



Source: Freeman, Torralba, Isola

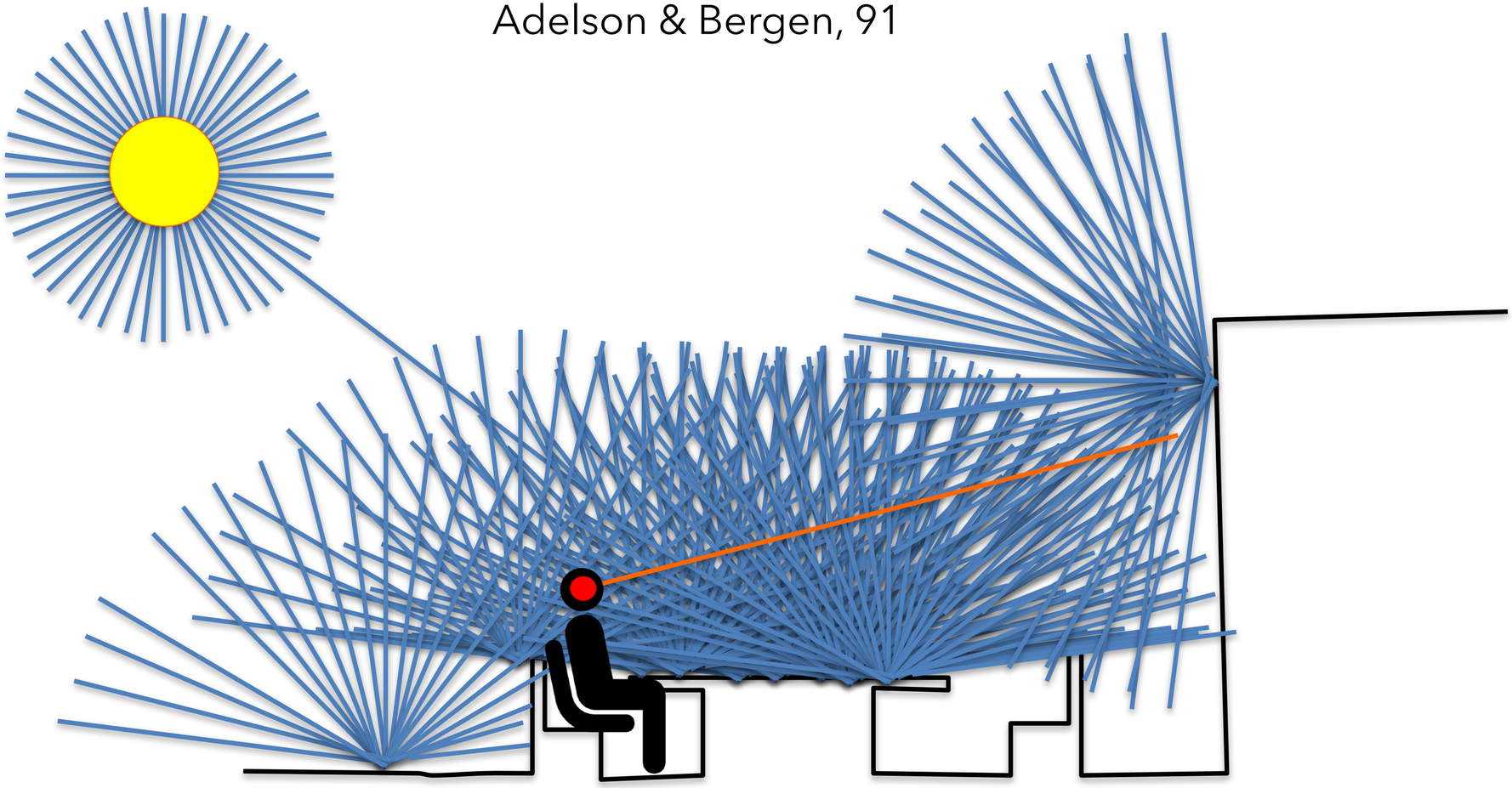
The structure of ambient light



Source: Freeman, Torralba, Isola

The Plenoptic Function

Adelson & Bergen, 91



The intensity P can be parameterized as:

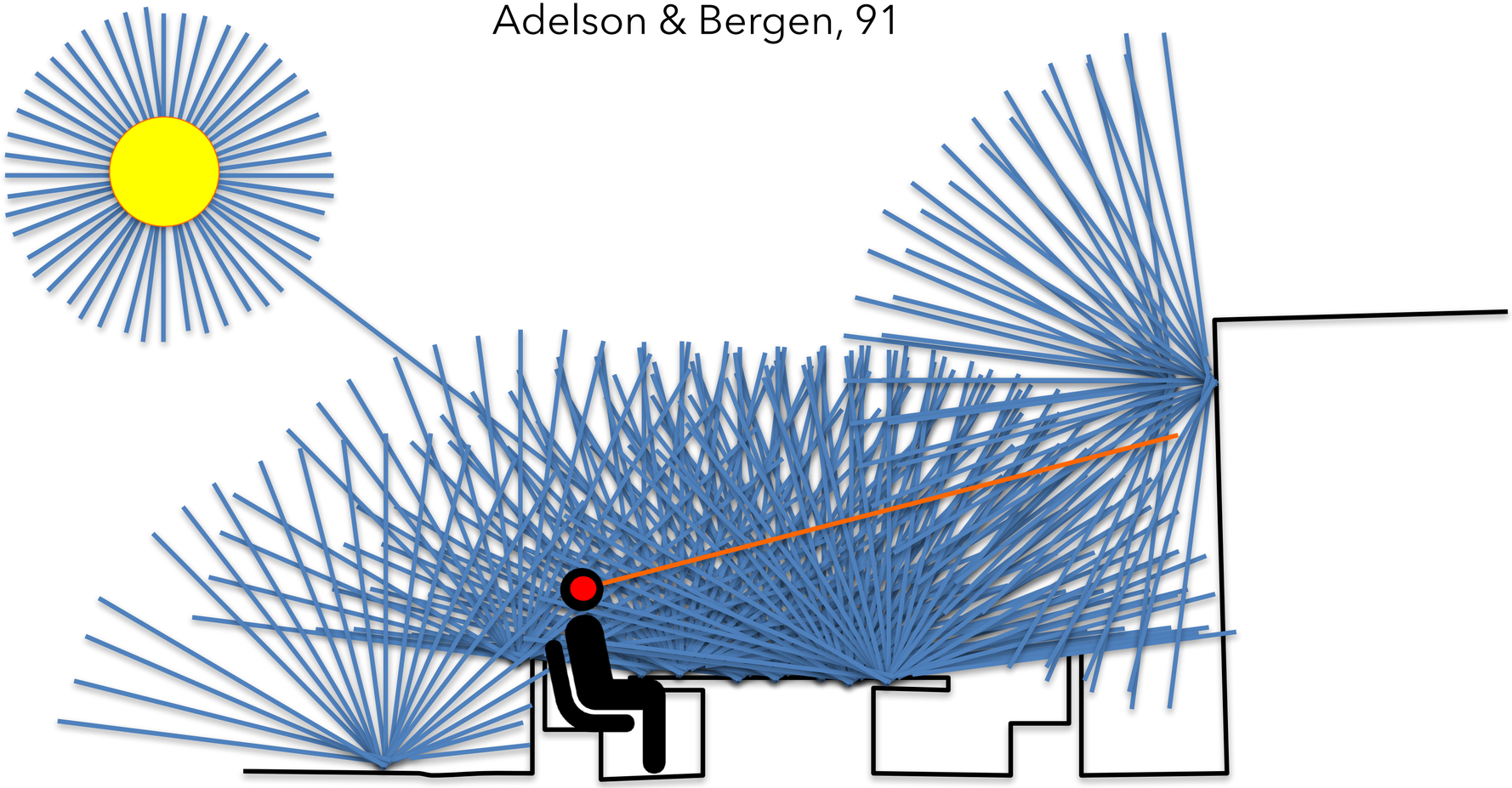
P (X, Y, Z)

Eye position

Source: Freeman, Torralba, Isola

The Plenoptic Function

Adelson & Bergen, 91



The intensity P can be parameterized as:

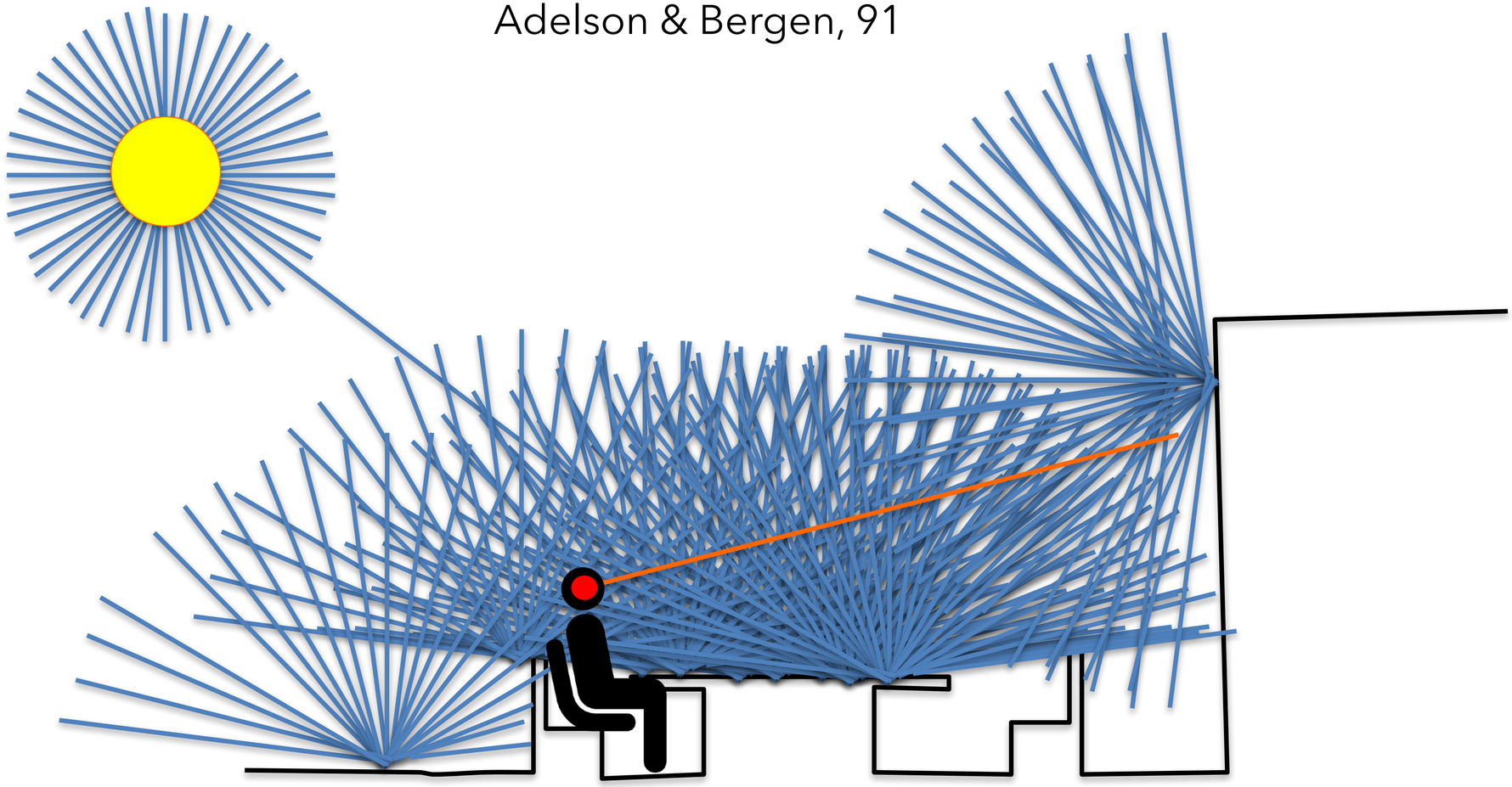
P (θ, ϕ, X, Y, Z)

Angle

Source: Freeman, Torralba, Isola

The Plenoptic Function

Adelson & Bergen, 91



The intensity P can be parameterized as:

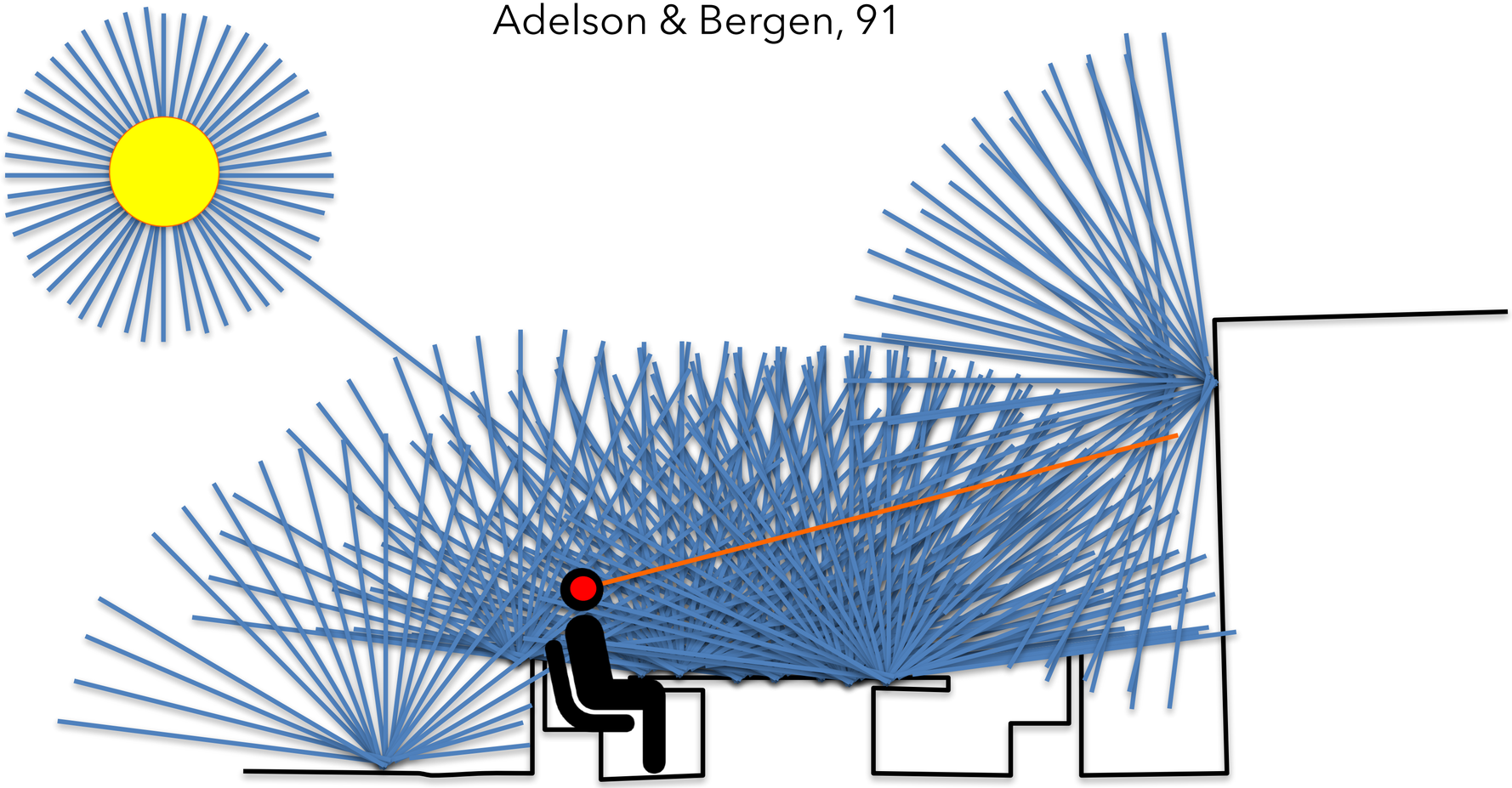
$$P(\theta, \phi, \lambda, t, X, Y, Z)$$

Wavelength, time

Source: Freeman, Torralba, Isola

The Plenoptic Function

Adelson & Bergen, 91



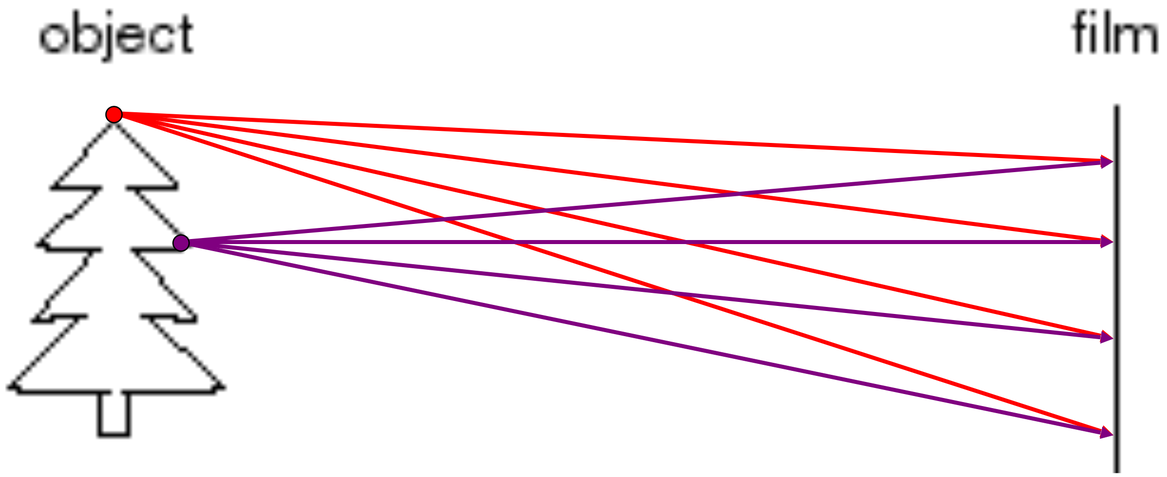
The intensity P can be parameterized as:

$$P(\theta, \phi, \lambda, t, X, Y, Z)$$

Full plenoptic function

Source: Freeman, Torralba, Isola

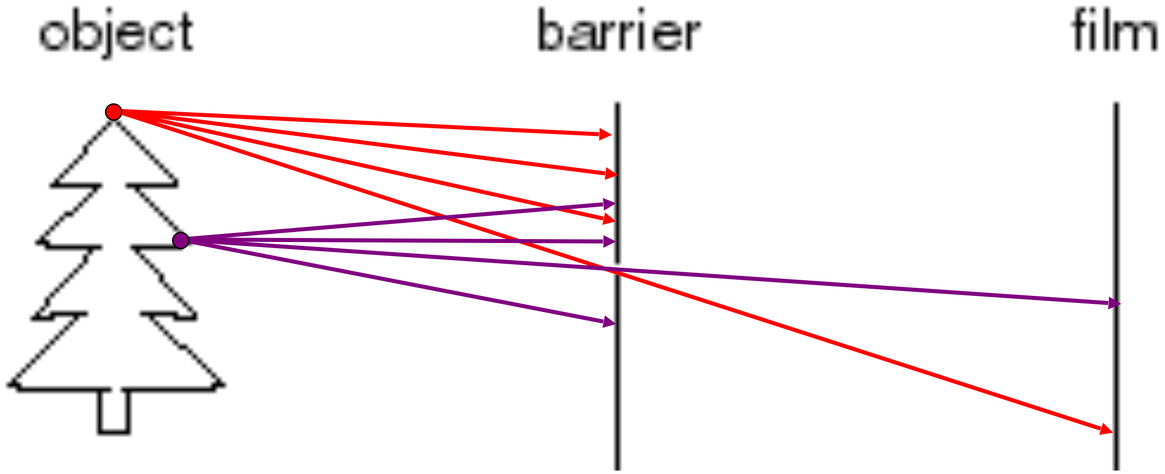
Making a camera



Idea #1: put a piece of film in front of an object.

Source: N. Snavely

Pinhole camera



Add a barrier to block off most of the rays

- This reduces blurring
- The opening known as the **aperture**

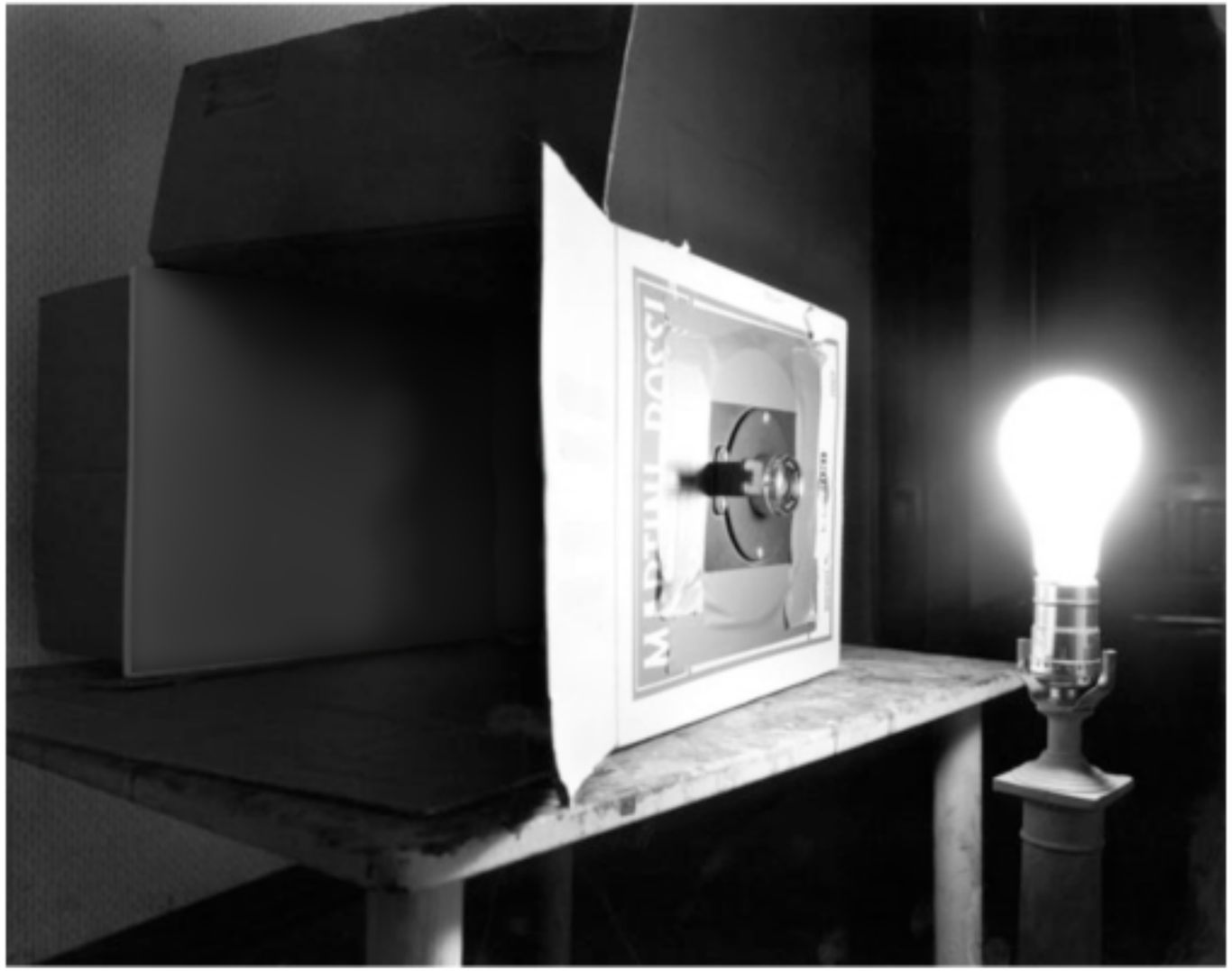
Source: N. Snavely

Pinhole camera

Photograph by Abelardo Morell, 1991

Source: Freeman, Torralba, Isola

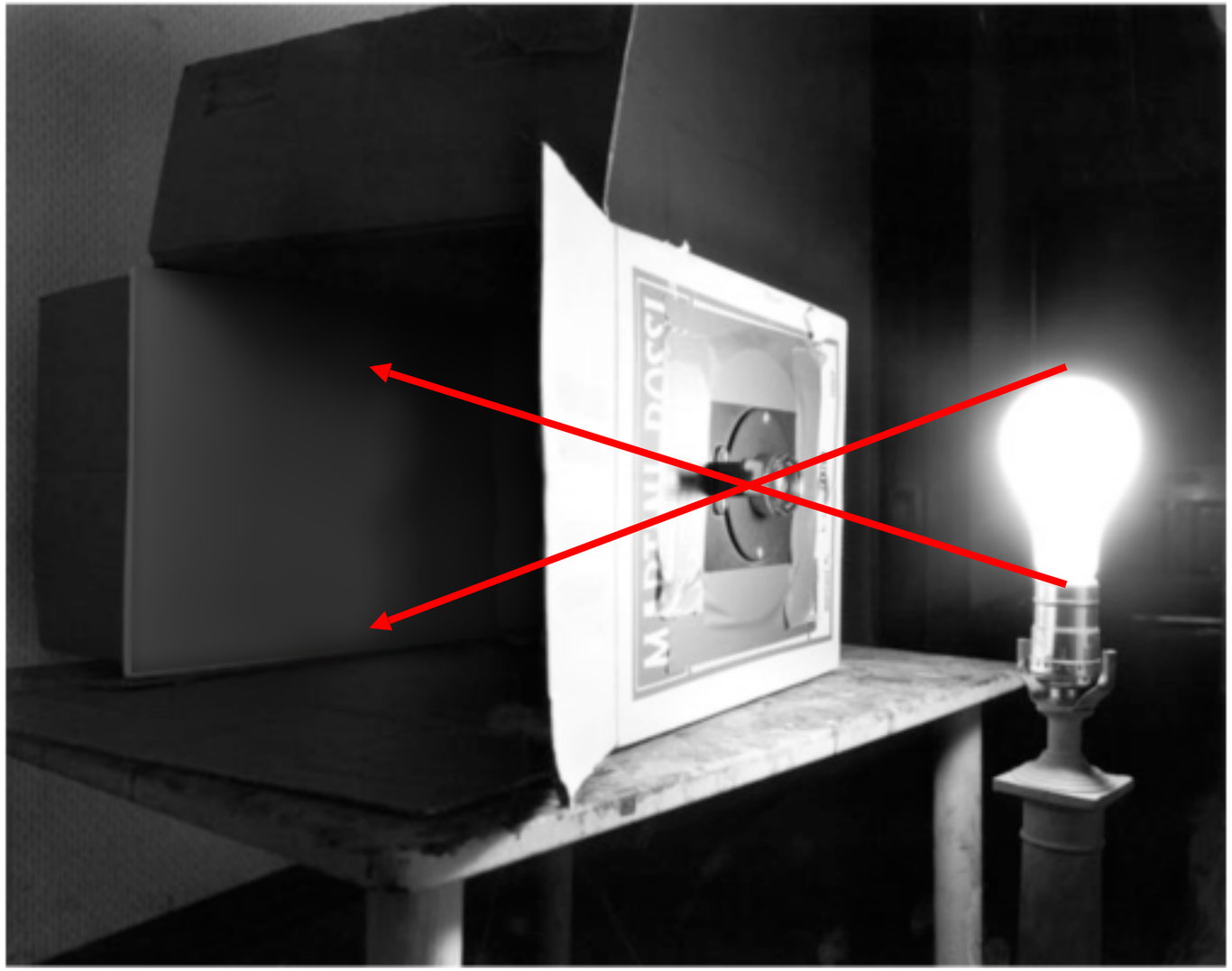
Pinhole camera



Photograph by Abelardo Morell, 1991

Source: Freeman, Torralba, Isola

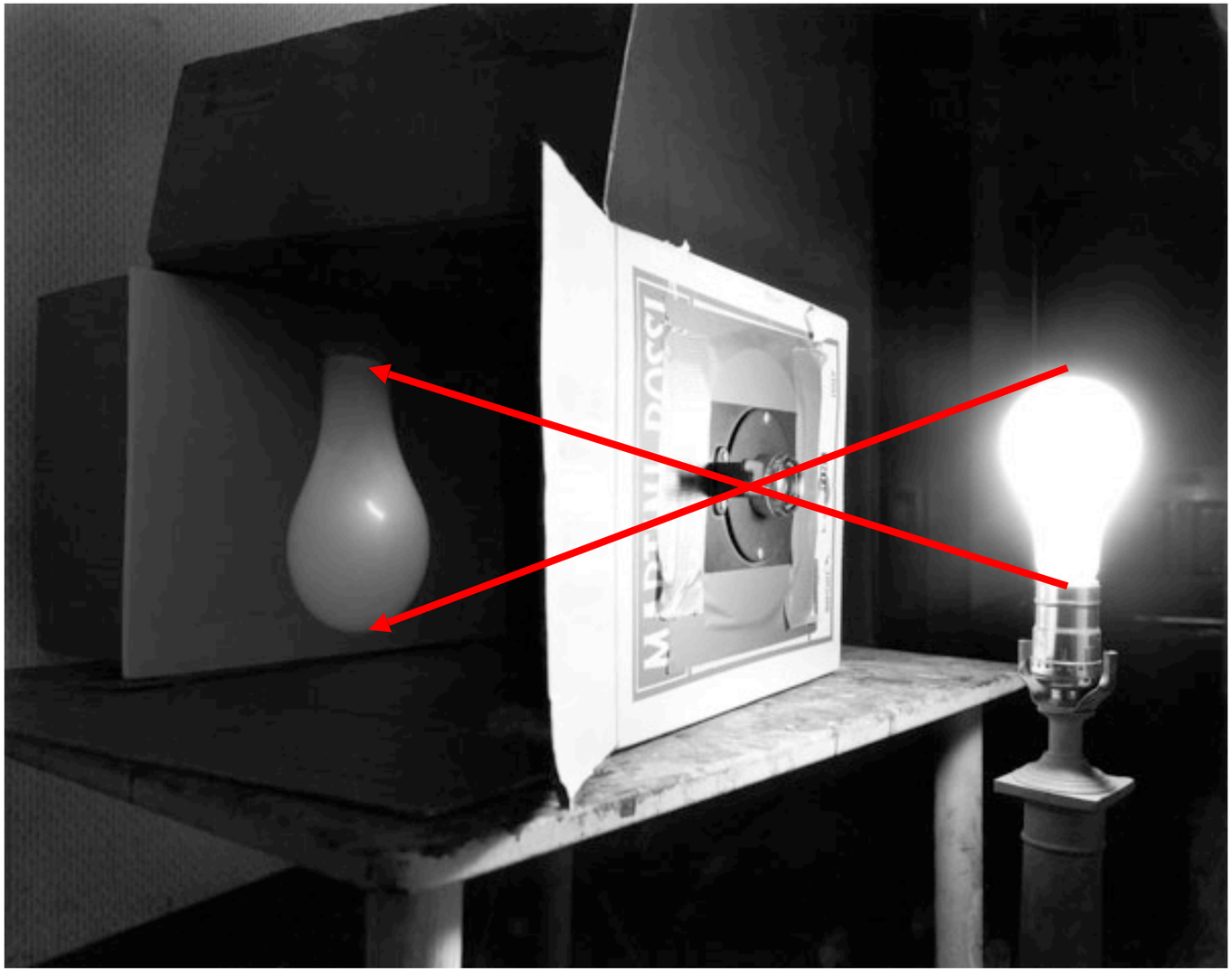
Pinhole camera



Photograph by Abelardo Morell, 1991

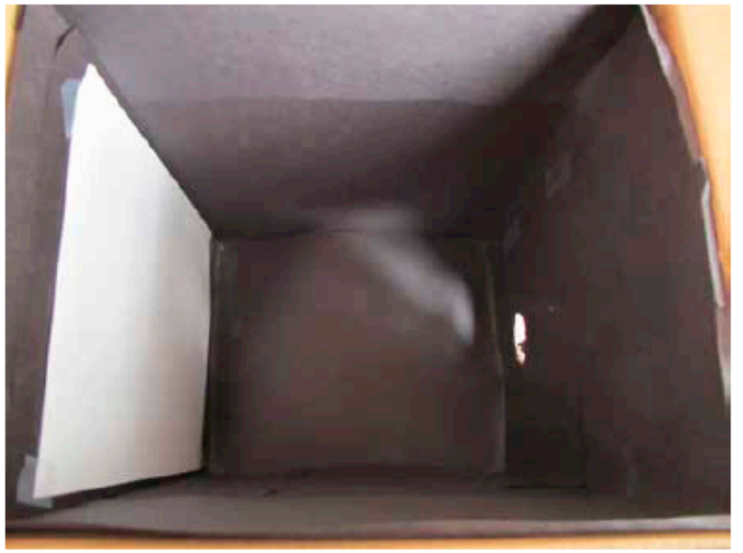
Source: Freeman, Torralba, Isola

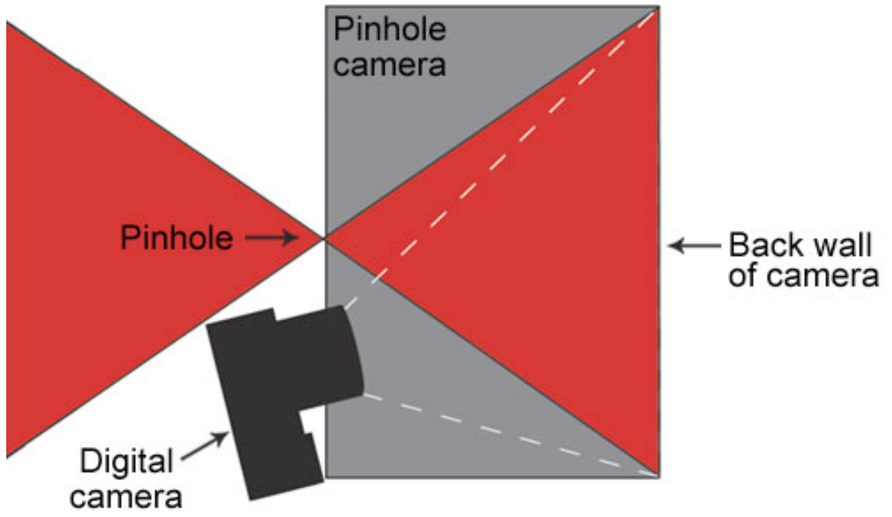
Pinhole camera



Photograph by Abelardo Morell, 1991

Source: Freeman, Torralba, Isola





http://www.foundphotography.com/PhotoThoughts/archives/2005/04/pinhole_camera_2.html

Source: Freeman, Torralba, Isola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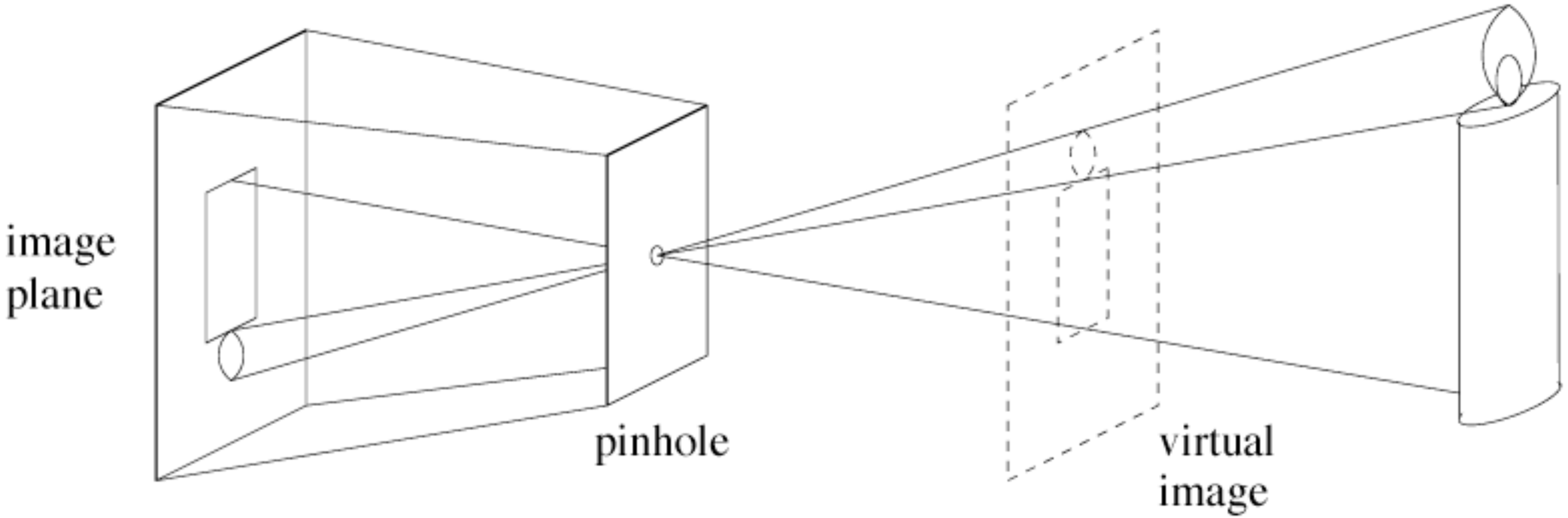
Upside down images!

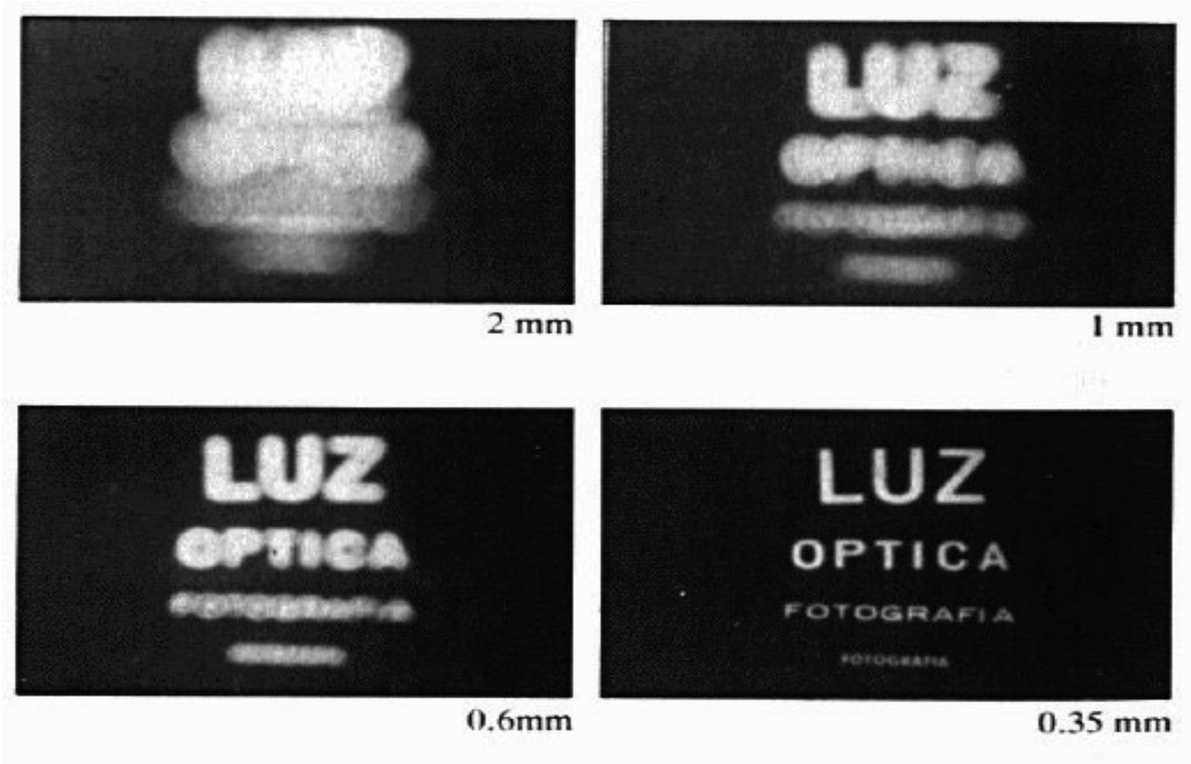


A useful concept: virtual image

Figure source: Forsyth & Ponce

Source: Freeman, Torralba, Isola

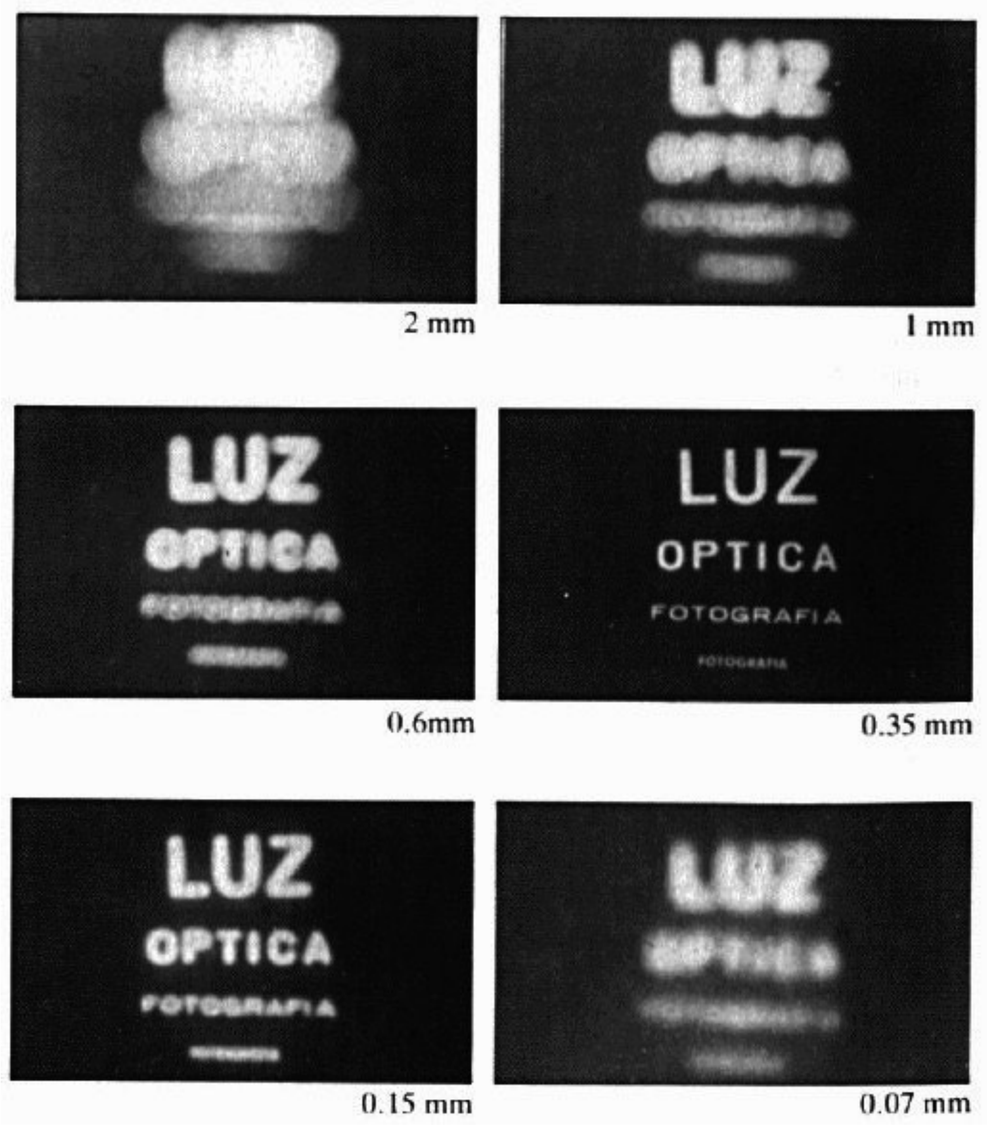
Shrinking the aperture



- Why not make the aperture as small as possible?
  - Less light gets through
  - *Diffraction* effects...

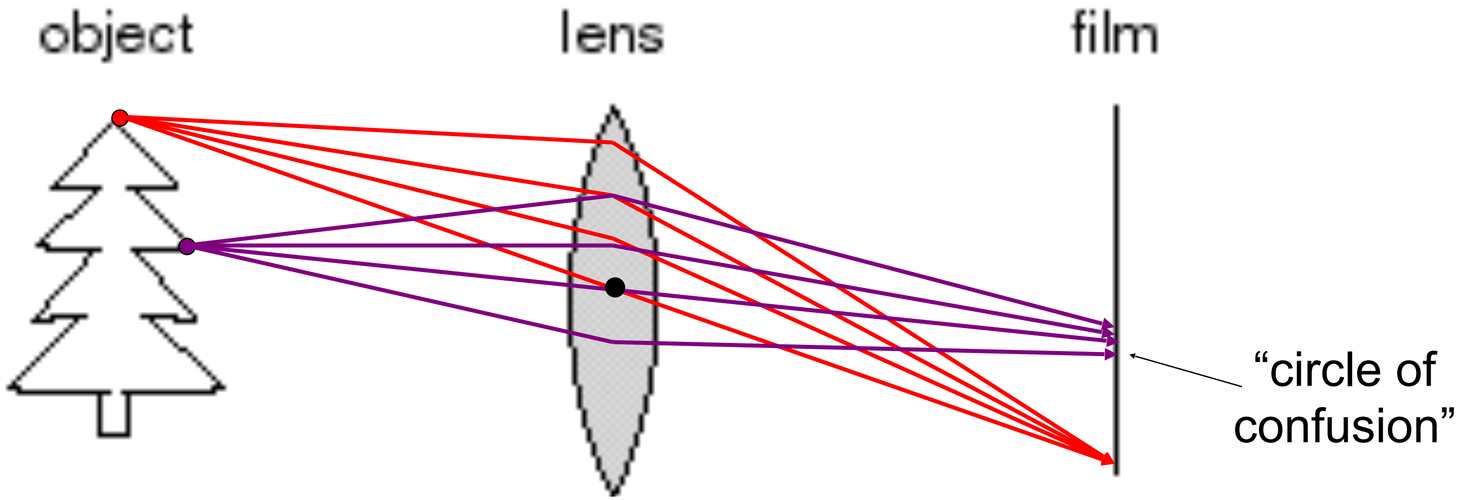
Source: N. Snavely

Shrinking the aperture



Source: N. Snavely

Adding a lens

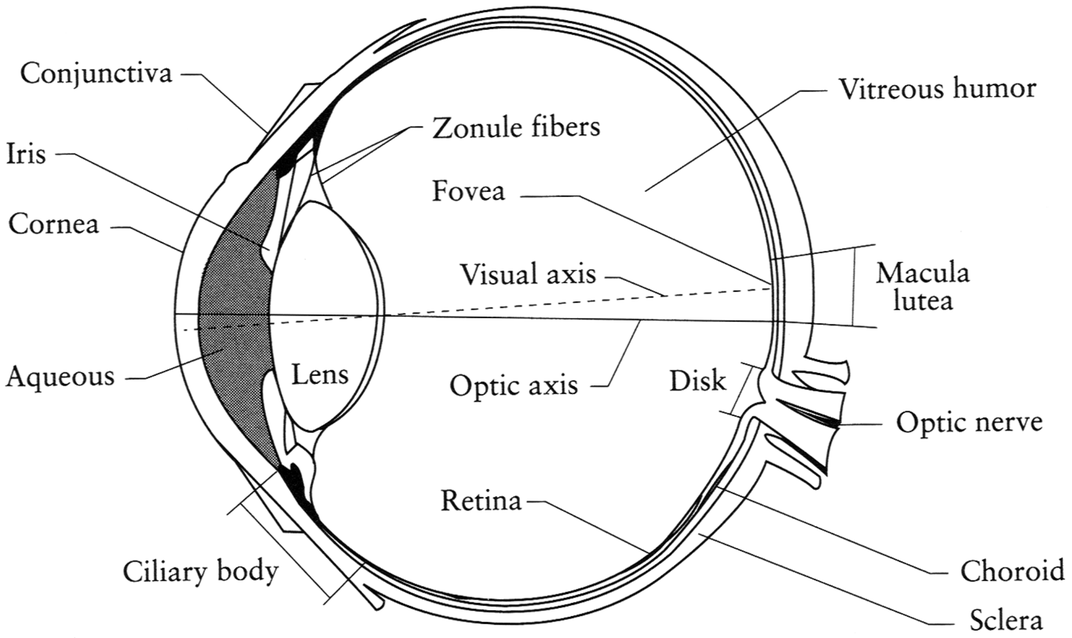


A lens focuses light onto the film

- There is a specific distance at which objects are “in focus”
  - Other points project to a “circle of confusion” in the image
- Changing the shape of the lens changes this distance

Source: N. Snavely

The eye



- The human eye is a camera:
  - **Iris**: colored annulus with radial muscles
  - **Pupil**: the hole (aperture) whose size is controlled by the iris
  - Photoreceptor cells (rods and cones) in the retina are analogous to film

Source: N. Snavely

Eyes in nature:
eyespots to pinhole camera

http://upload.wikimedia.org/wikipedia/commons/6/6d/Mantis_shrimp.jpg

Source: Freeman, Torralba, Isola

Pinhole cameras in unexpected places

Tree shadow during a solar eclipse

photo credit: Nils van der Burg

http://www.physicstogo.org/index.cfm

Source: Steve Seitz

Source: Freeman, Torralba, Isola

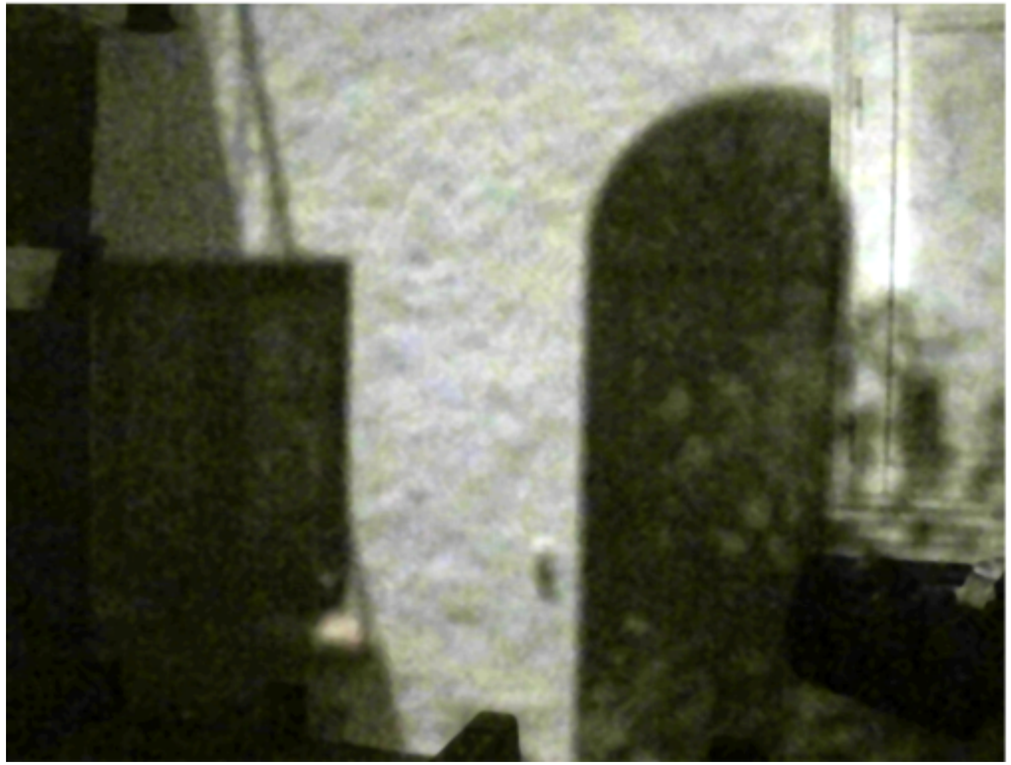
Source: Freeman, Torralba, Isola

Source: Freeman, Torralba, Isola

Accidental pinhole camera

Source: Freeman, Torralba, Isola

Window turned into a pinhole



View outside

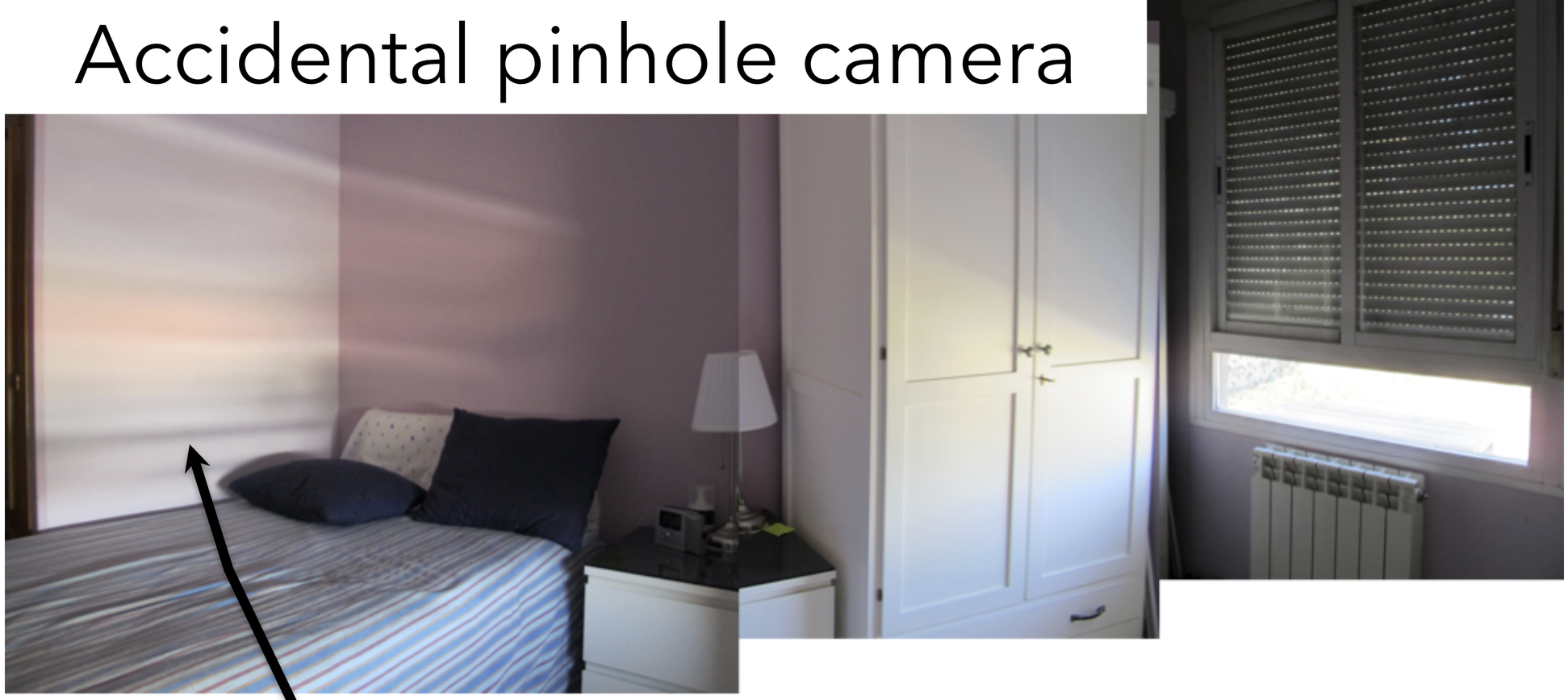
Source: Freeman, Torralba, Isola

Window open

Window turned into a pinhole

Source: Freeman, Torralba, Isola

Accidental pinhole camera



Outside scene

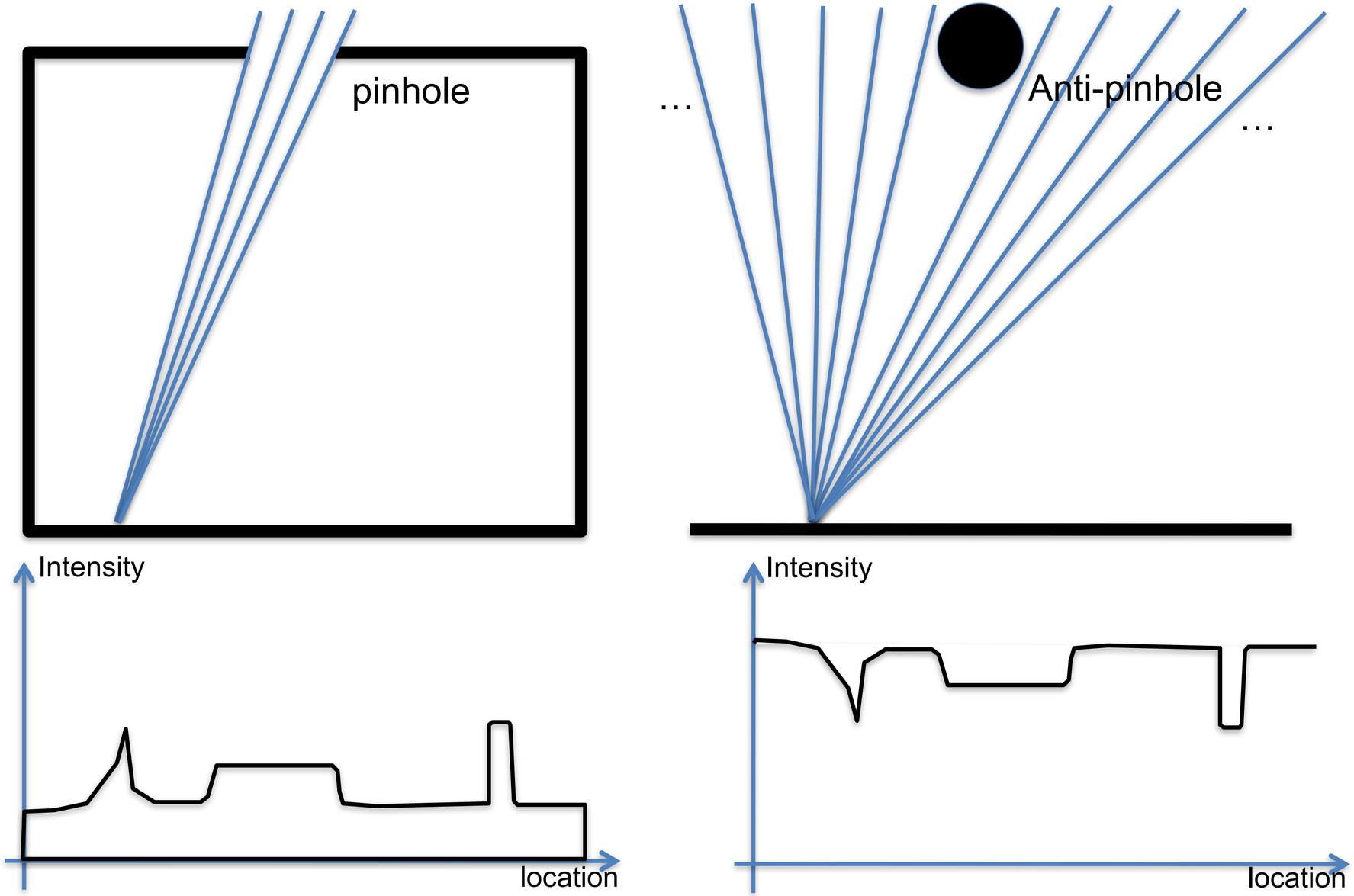
*

Aperture

See Zomet, A.; Nayar, S.K. CVPR 2006 for a detailed analysis.

Source: Freeman, Torralba, Isola

Pinhole and Anti-pinhole cameras



Adam L. Cohen, 1982

Source: Freeman, Torralba, Isola

Mixed accidental pinhole and anti-pinhole cameras

Mixed accidental pinhole and anti-pinhole cameras

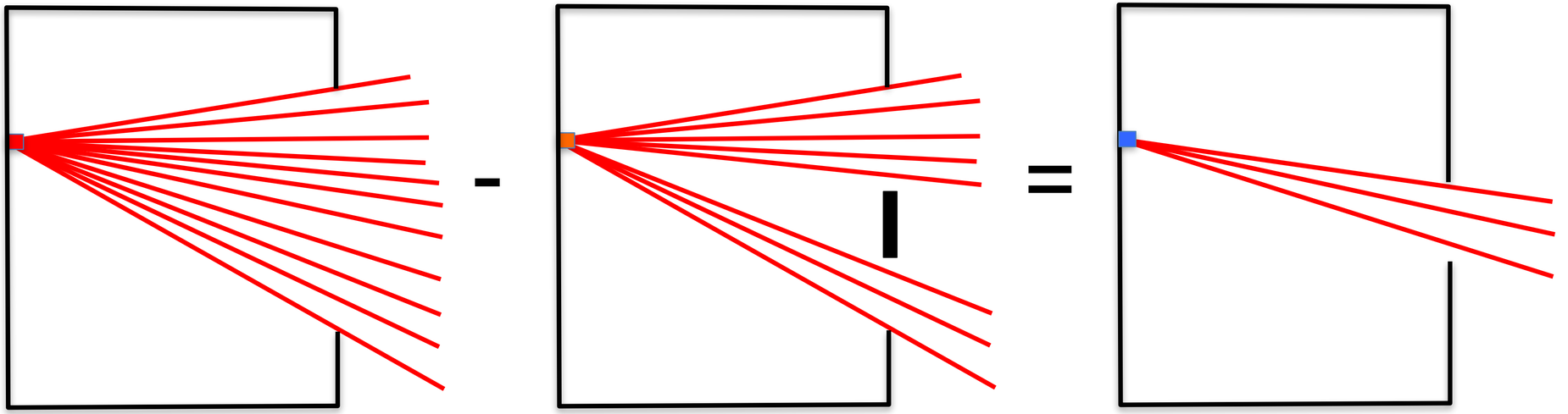
Source: Freeman, Torralba, Isola

Mixed accidental pinhole and anti-pinhole cameras

Room with a window

Person in front of the window

Difference image



= ?

Source: Freeman, Torralba, Isola

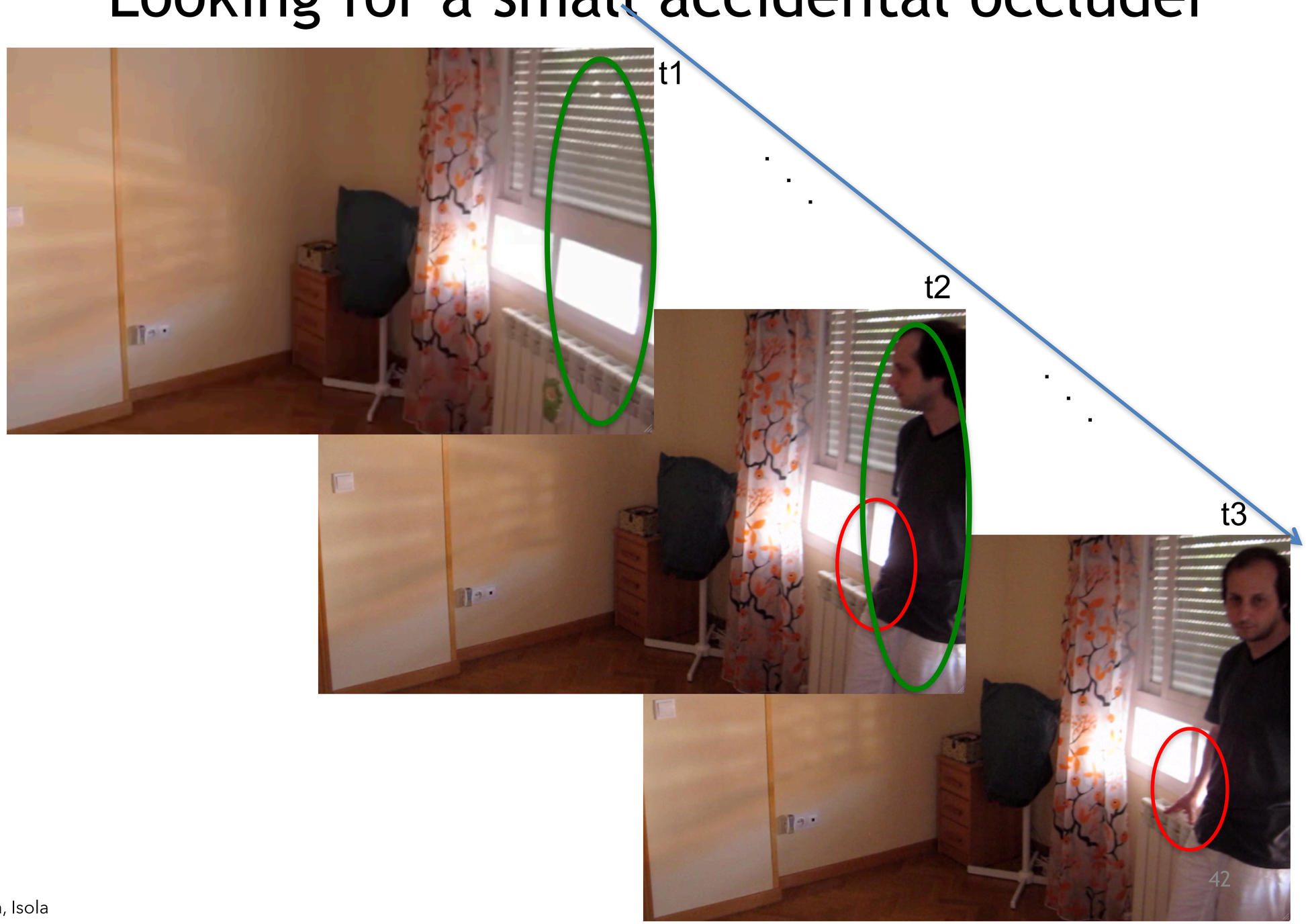
Mixed accidental pinhole and anti-pinhole cameras

Body as the occluder

View outside the window

Source: Freeman, Torralba, Isola

Looking for a small accidental occluder



Source: Freeman, Torralba, Isola

Looking for a small accidental occluder

Body as the occluder

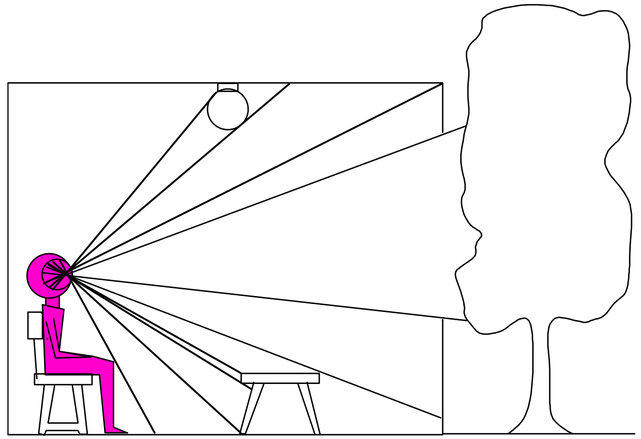
Hand as the occluder

View outside the window

Source: Freeman, Torralba, Isola

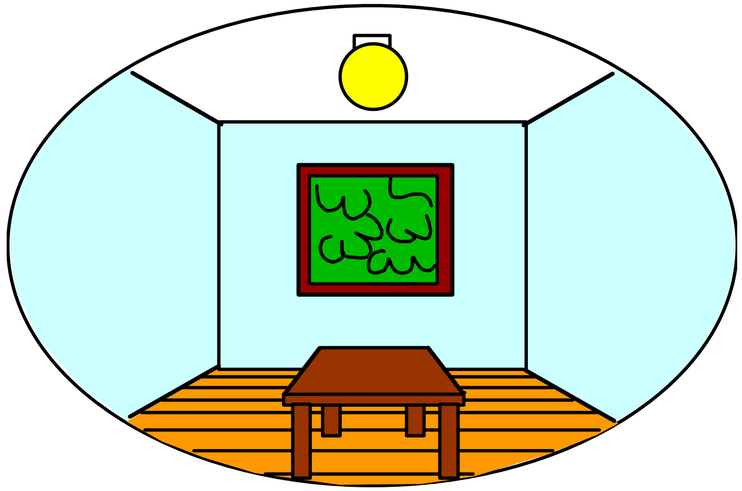
Projection from 3D to 2D

3D world



Point of observation

2D image

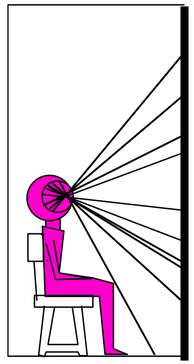


Slide by A. Efros

Figure source: Stephen E. Palmer, 2002

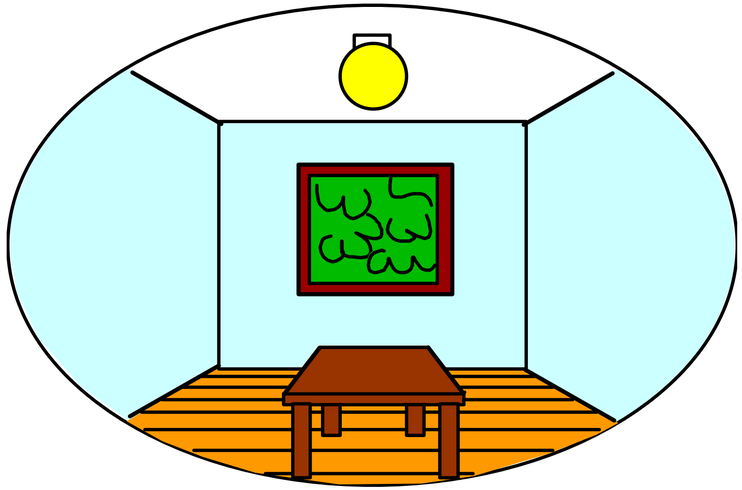
Projection from 3D to 2D

3D world



Painted backdrop?

2D image



Source: S. Lazebnik

Fooling the eye

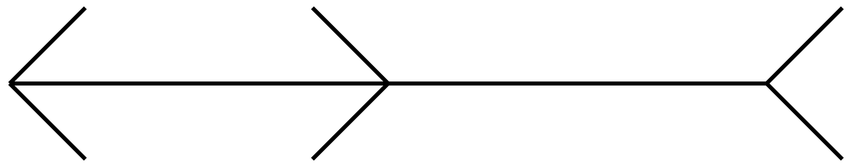
Source: S. Lazebnik

Fooling the eye

Making of 3D sidewalk art: http://www.youtube.com/watch?v=3SNYtd0Ayt0

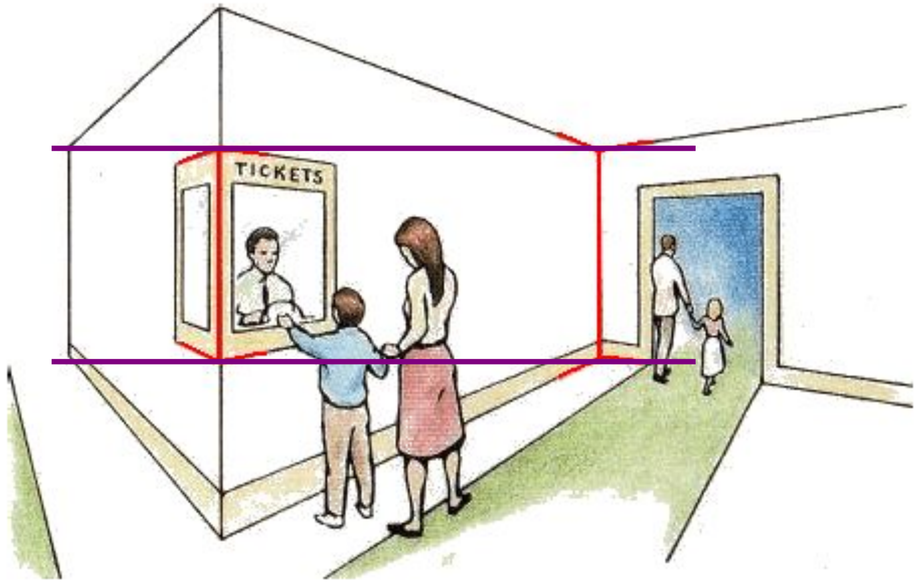
Source: S. Lazebnik

Müller-Lyer Illusion

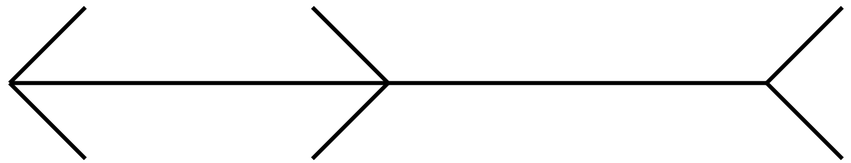


Source: N. Snavely, S. Lazebnik

Müller-Lyer Illusion



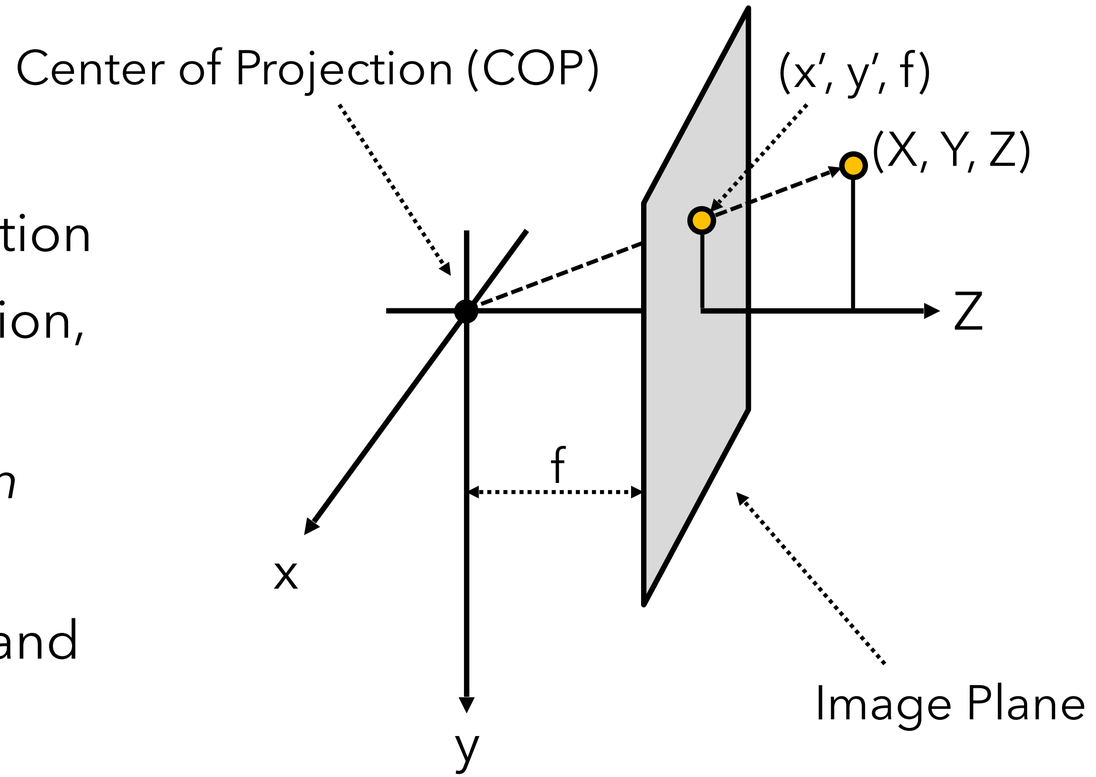
http://www.michaelbach.de/ot/sze_muelue/index.html



Source: N. Snavely, S. Lazebnik

Modeling projection

- The coordinate system
  - We use the pinhole model as an approximation
  - Put the optical center (aka Center of Projection, or COP) at the origin
  - Put the Image Plane (aka Projection Plane) *in front* of the COP (the virtual image idea)
  - The camera looks down the *positive* z-axis, and the y-axis points down



Source: N. Snavely

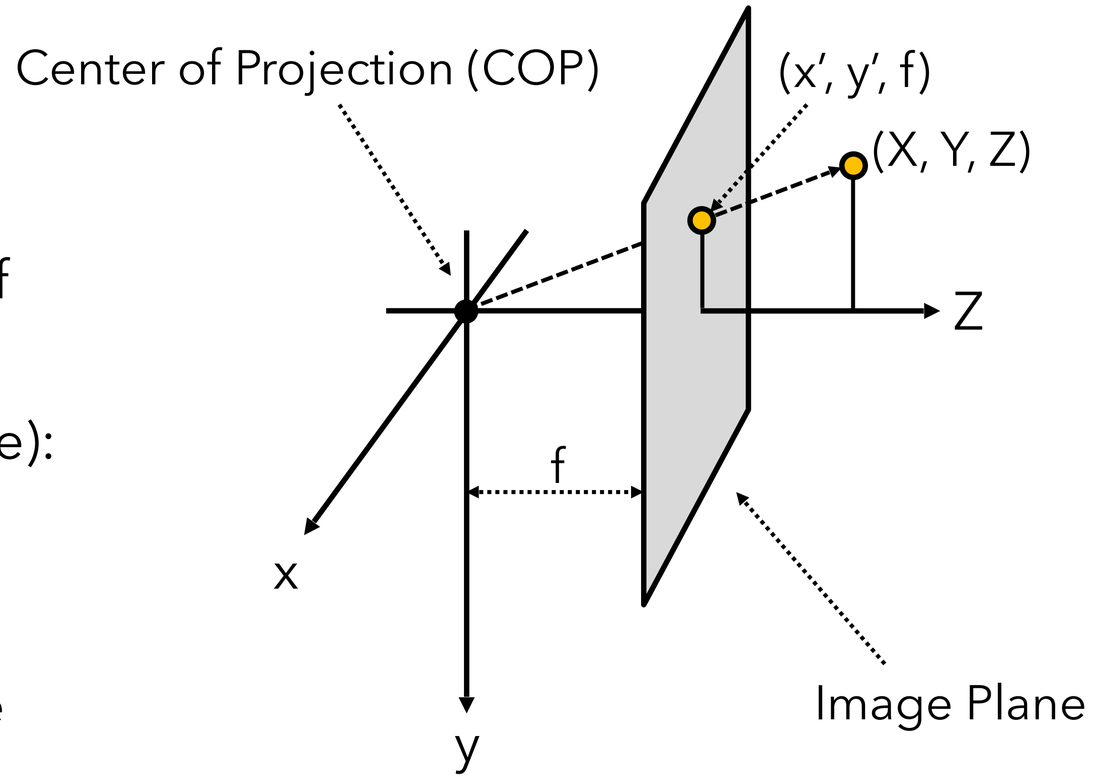
Modeling projection

- Projection equations
  - Compute intersection with image plane of ray from (X,Y,Z) to COP
  - Derived using similar triangles (as we'll see):

$$(x, y, z) \rightarrow (f\frac{x}{z}, f\frac{y}{z}, f)$$

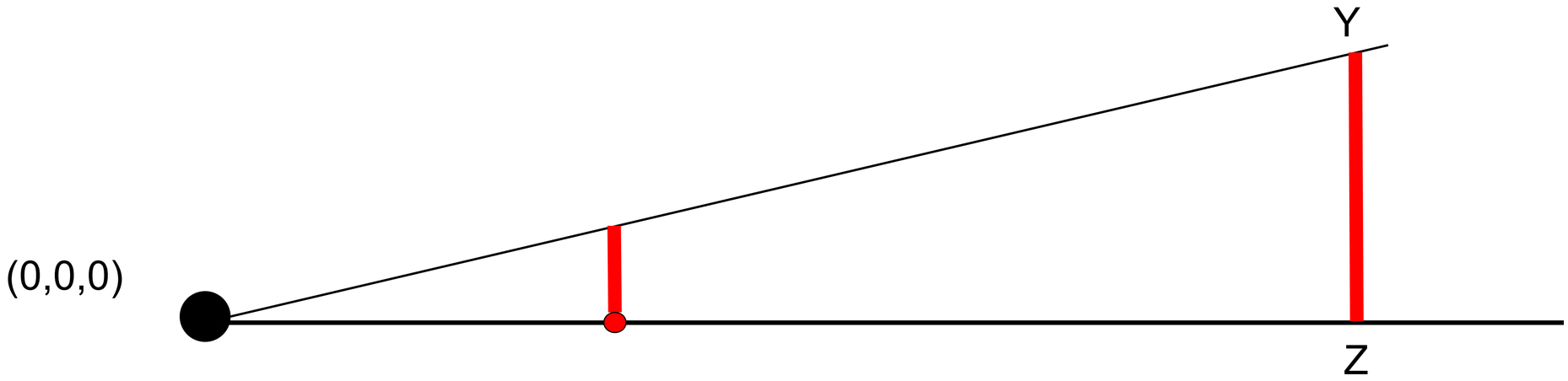
  - We get the projection by throwing out the last coordinate:

$$(x, y, z) \rightarrow (f\frac{x}{z}, f\frac{y}{z})$$



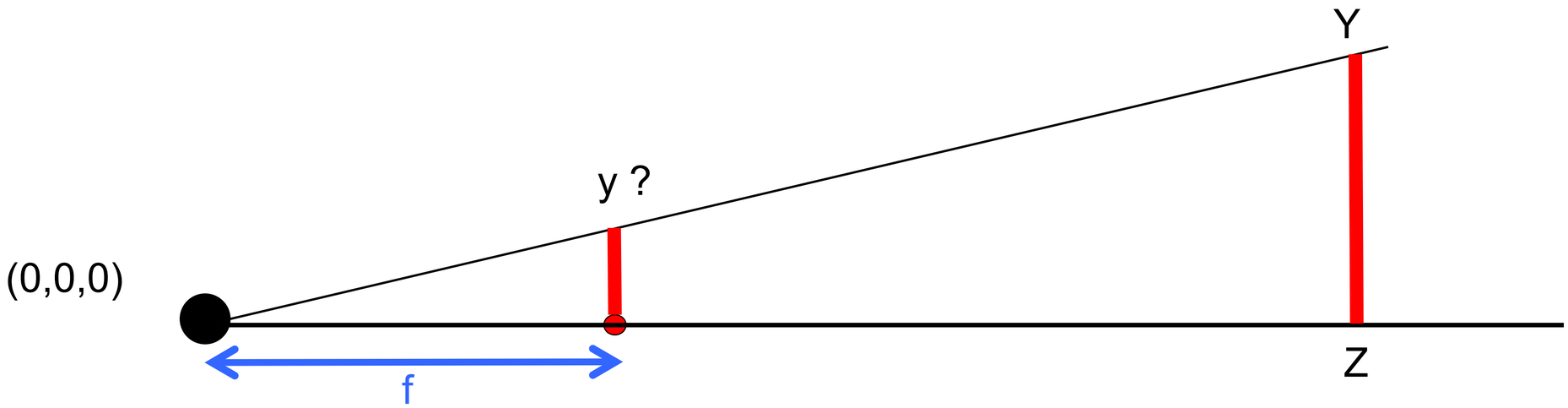
Source: N. Snavely

Perspective projection (in 1D)



Source: Freeman, Torralba, Isola

Perspective projection



Similar triangles: y / f = Y / Z

y = f Y/Z

How can we represent this more compactly?

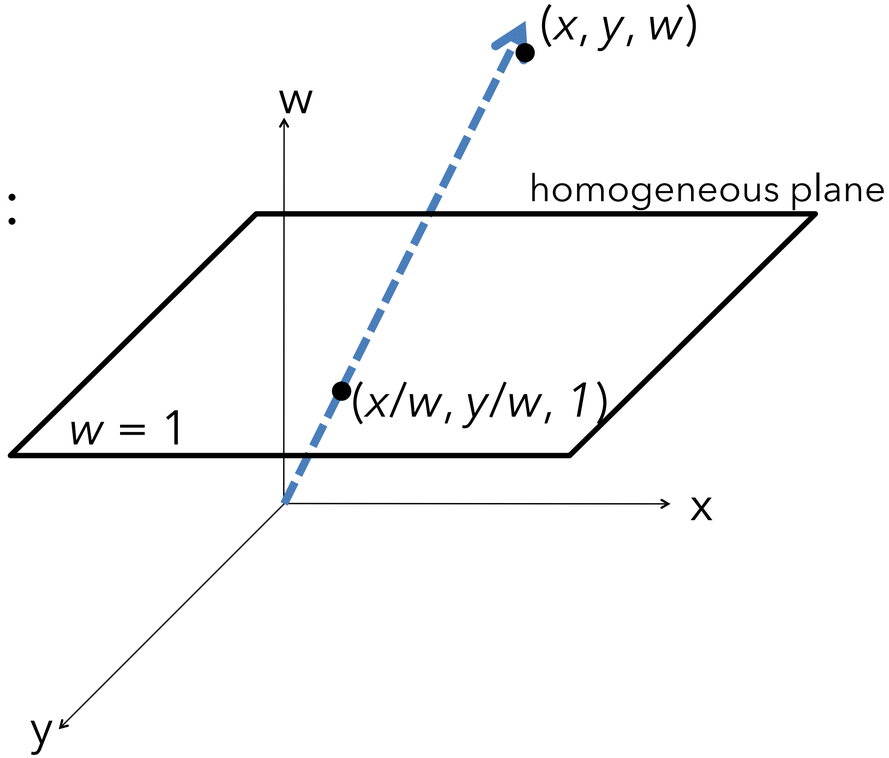
Source: Freeman, Torralba, Isola

Homogeneous coordinates

Trick: add one more coordinate:

$$(x, y) \Rightarrow \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

homogeneous image coordinates



Converting *from* homogeneous coordinates

$$\begin{bmatrix} x \\ y \\ w \end{bmatrix} \Rightarrow (x/w, y/w)$$

Source: N. Snavely

Application: translation with homogeneous coordinates

- Implement translation using a matrix multiplication

$$\mathbf{T} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$$

$$\begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} = \begin{bmatrix} x + t_x \\ y + t_y \\ 1 \end{bmatrix}$$

Source: N. Snavely

Affine transformations

$$\mathbf{T} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix}$$

any transformation represented by a 3x3 matrix with last row [0 0 1] we call an *affine* transformation

$$\begin{bmatrix} a & b & c \\ d & e & f \\ 0 & 0 & 1 \end{bmatrix}$$

Source: N. Snavely

Examples of Affine Transformations

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

Translate

$$\begin{bmatrix} \boldsymbol{x}' \\ \boldsymbol{y}' \\ 1 \end{bmatrix} = \begin{bmatrix} \boldsymbol{s}_x & 0 & 0 \\ 0 & \boldsymbol{s}_y & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \boldsymbol{x} \\ \boldsymbol{y} \\ 1 \end{bmatrix}$$

Scale

$$\begin{bmatrix} x' \\ y' \\ 1 \end{bmatrix} = \begin{bmatrix} \cos\theta & -\sin\theta & 0 \\ \sin\theta & \cos\theta & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ 1 \end{bmatrix}$$

2D *in-plane* rotation

$$\begin{bmatrix} \boldsymbol{x}' \\ \boldsymbol{y}' \\ 1 \end{bmatrix} = \begin{bmatrix} 1 & \boldsymbol{sh}_x & 0 \\ \boldsymbol{sh}_y & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \boldsymbol{x} \\ \boldsymbol{y} \\ 1 \end{bmatrix}$$

Shear

Source: N. Snavely

Perspective Projection

Projection is a matrix multiply using homogeneous coordinates:

$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1/f & 0 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix} = \begin{bmatrix} x \\ y \\ z/f \end{bmatrix} \Rightarrow (f\frac{x}{z}, f\frac{y}{z})$$

divide by third coordinate

This is known as **perspective projection**

- The matrix is the **projection matrix**

Source: N. Snavely

Perspective Projection

How does scaling the projection matrix change the transformation?

$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1/f & 0 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix} = \begin{bmatrix} x \\ y \\ z/f \end{bmatrix} \Rightarrow (f\frac{x}{z}, f\frac{y}{z})$$

What if we scale by *f*?

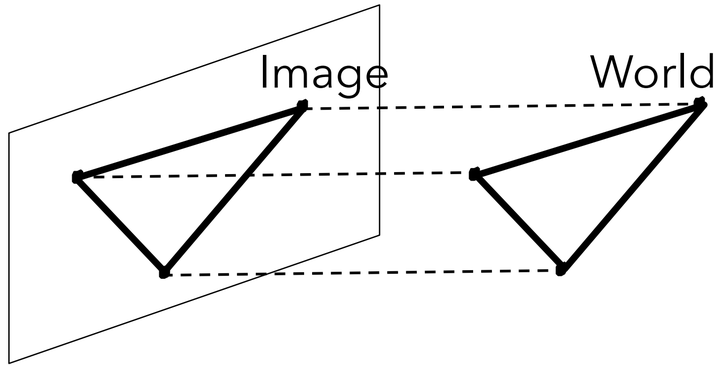
$$\begin{bmatrix} f & 0 & 0 & 0 \\ 0 & f & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix} = \begin{bmatrix} fx \\ fy \\ z \end{bmatrix} \Rightarrow (f\frac{x}{z}, f\frac{y}{z})$$

Scaling a projection matrix produces an equivalent projection matrix!

Source: N. Snavely

Orthographic projection

- Special case of perspective projection
  - Distance from the COP to the PP is infinite

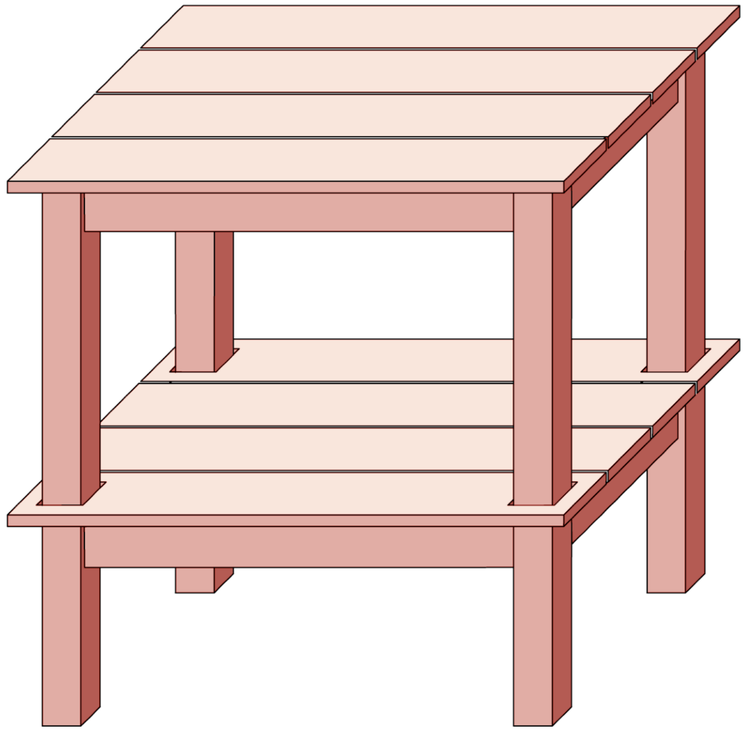


  - Good approximation for telephoto optics
  - Also called “parallel projection”: (x, y, z) → (x, y)

$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \\ 1 \end{bmatrix} = \begin{bmatrix} x \\ y \\ 1 \end{bmatrix} \Rightarrow (x, y)$$

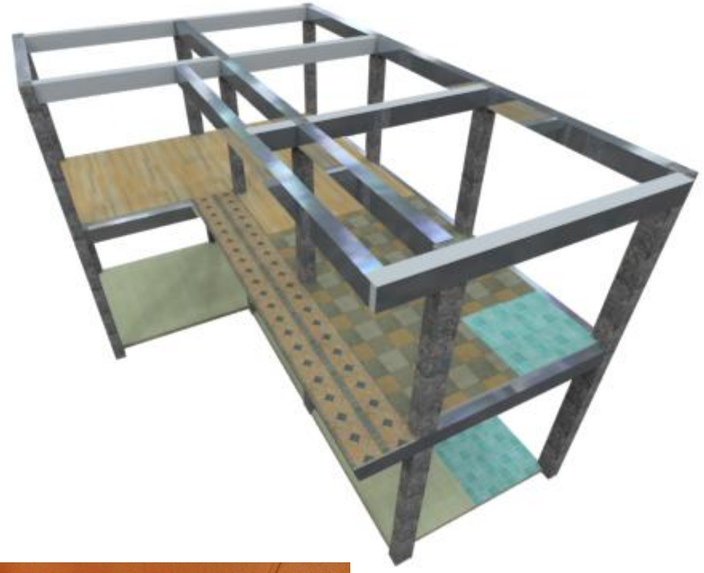
Source: N. Snavely

Orthographic projection



Source: N. Snavely

Perspective projection



Source: N. Snavely

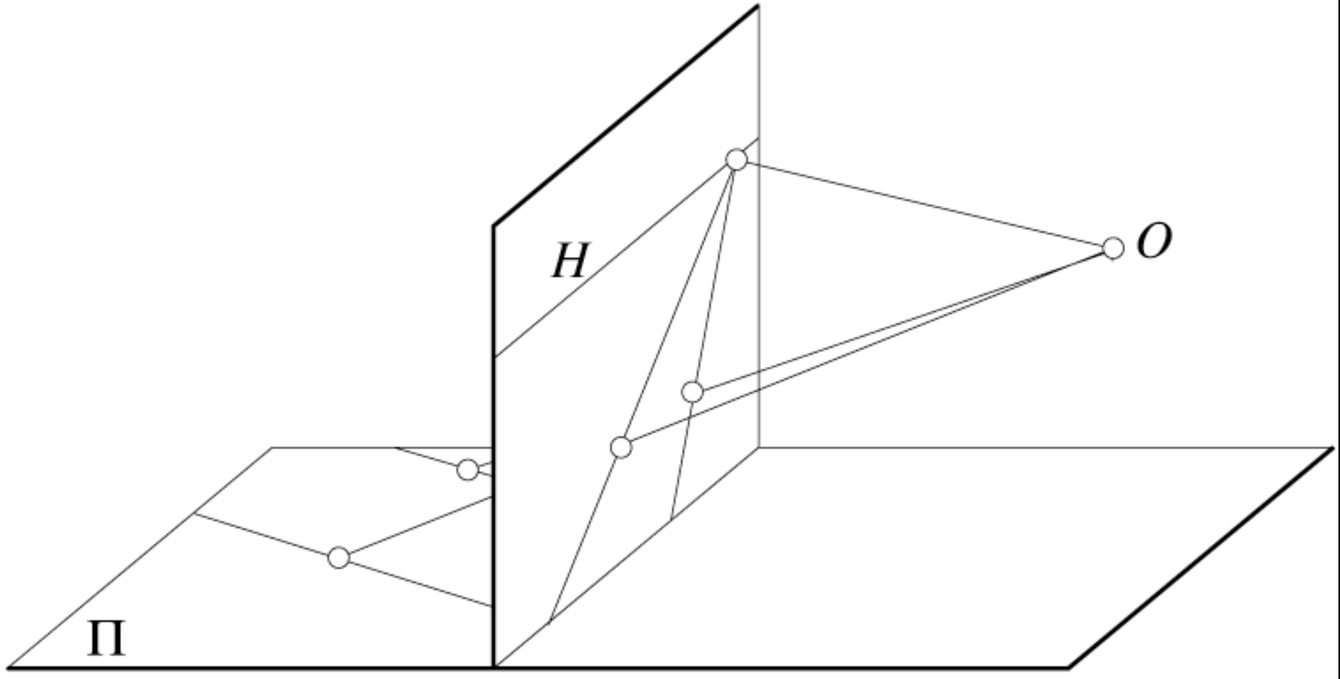
Projection properties

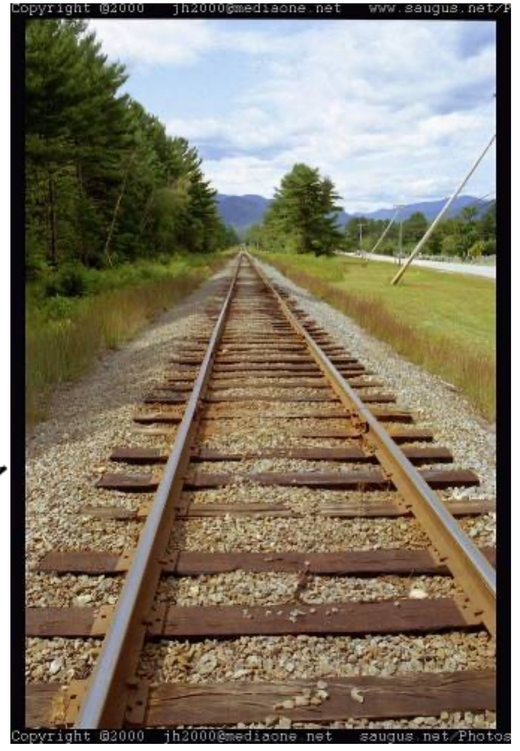
- Many-to-one: any points along same ray map to same point in image
- Points → points
- Lines → lines (collinearity is preserved)
  - But line through focal point projects to a point
- Planes → planes (or half-planes)
  - But plane through focal point projects to line

Source: N. Snavely

Projection properties

- Parallel lines converge at a vanishing point
  - Each direction in space has its own vanishing point
  - But lines parallel to the image plane remain parallel

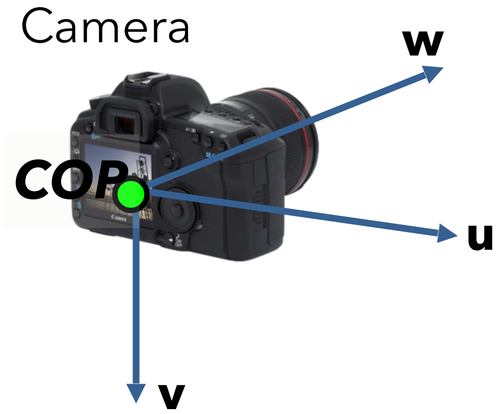


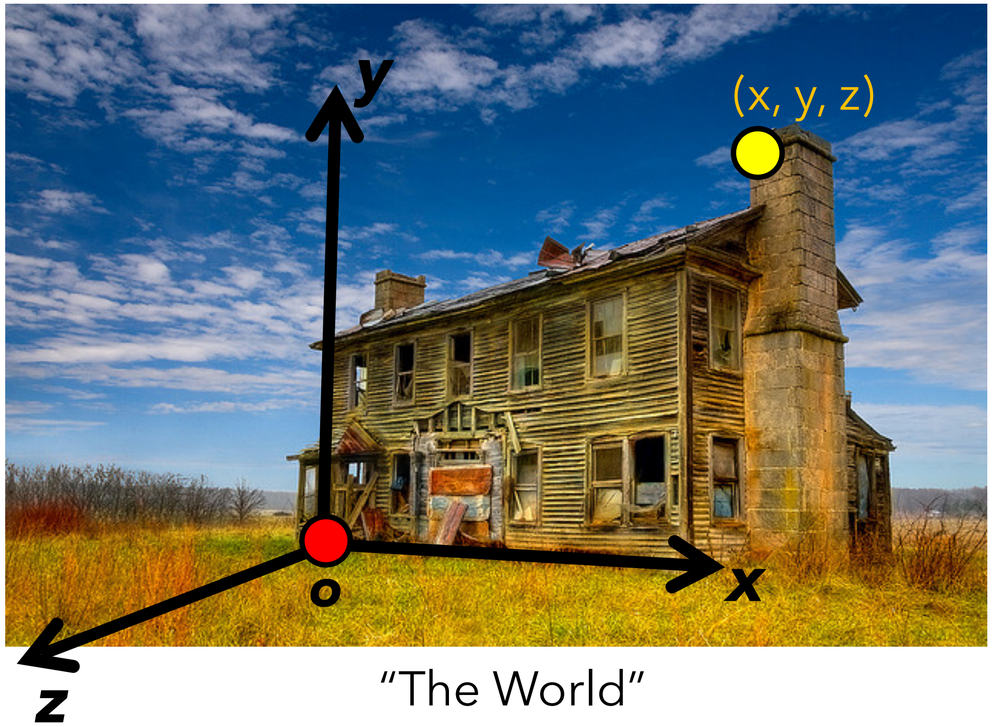


Source: N. Snavely

Camera parameters

- How can we model the geometry of a camera?





"The World"

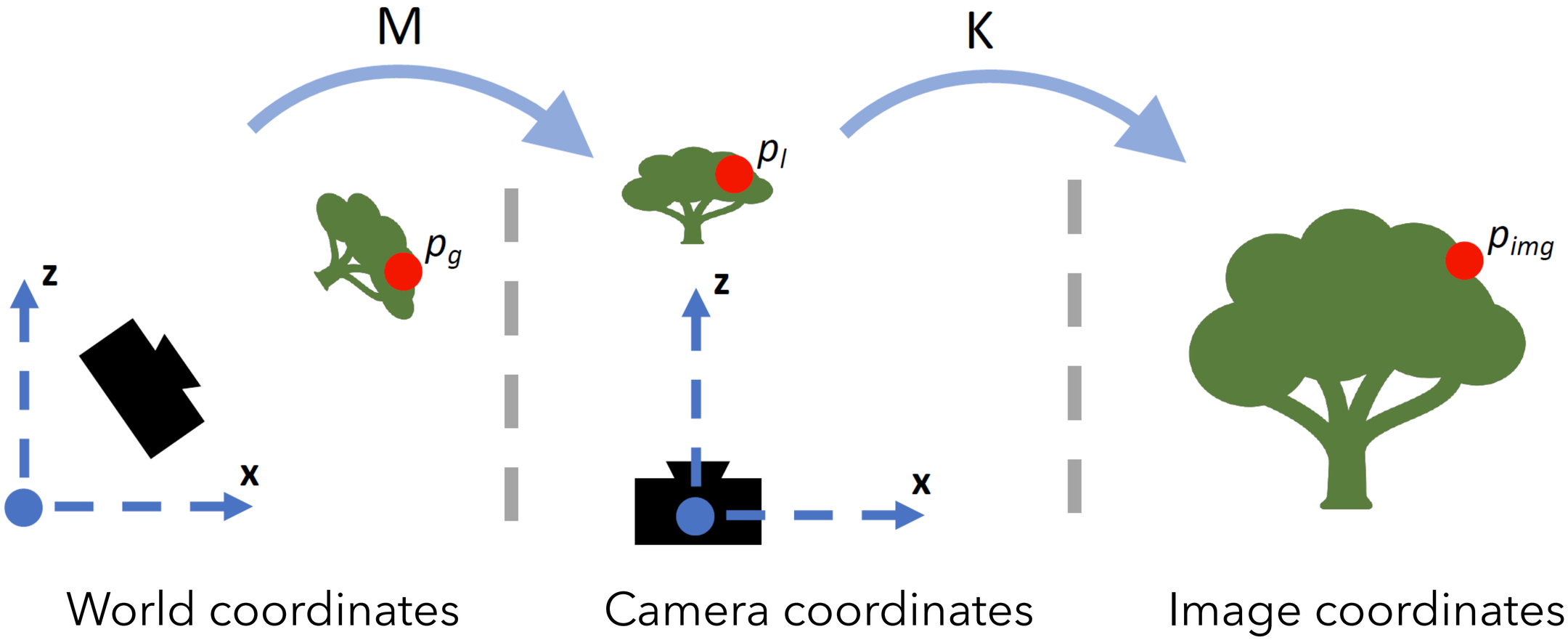
Three important coordinate systems:

1. *World* coordinates
2. *Camera* coordinates
3. *Image* coordinates

How do we project a given world point (x, y, z) to an image point?

Source: N. Snavely

Coordinate frames



Source: N. Snavely
Figure credit: Peter Hedman

Camera parameters

To project a point (*x*, *y*, *z*) in *world* coordinates into a camera

- First transform (*x*, *y*, *z*) into *camera* coordinates
- Need to know
  - Camera position (in world coordinates)
  - Camera orientation (in world coordinates)
- Then project into the image plane to get *image (pixel) coordinates*
  - Need to know camera *intrinsics*

Source: N. Snavely

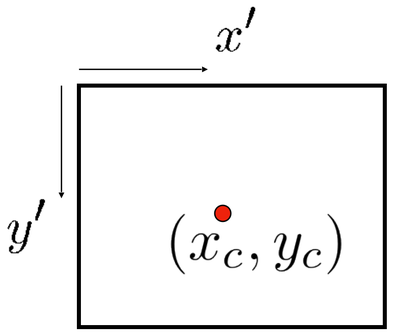
Camera parameters

A camera is described by several parameters

- Translation T of the optical center from the origin of world coords
- Rotation R of the image plane
- focal length f, principal point (x_c, y_c), pixel aspect size α
- blue parameters are called "extrinsics," red are "intrinsics"

Projection equation:

$$\mathbf{x} = \begin{bmatrix} sx \\ sy \\ s \end{bmatrix} = \begin{bmatrix} * & * & * & * \\ * & * & * & * \\ * & * & * & * \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \\ 1 \end{bmatrix} = \mathbf{\Pi X}$$



- The projection matrix models the cumulative effect of all parameters
- Useful to decompose into a series of operations

identity matrix

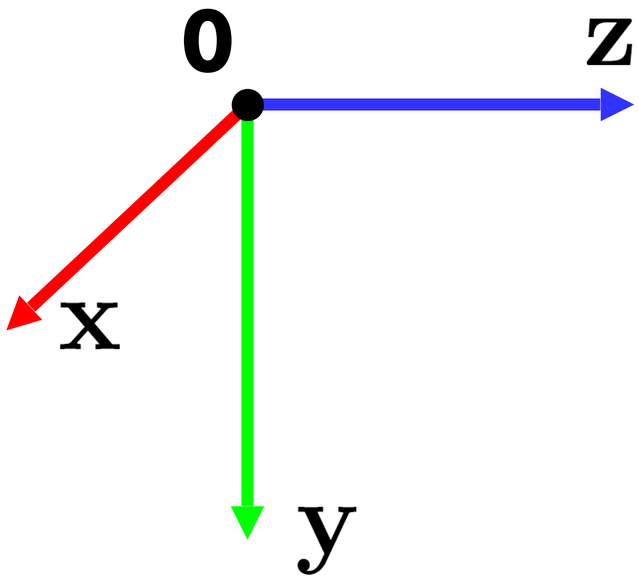
$$\mathbf{\Pi} = \begin{bmatrix} f & s & c_x \\ 0 & \alpha f & c_y \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix} \begin{bmatrix} \mathbf{R}_{3\times3} & \mathbf{0}_{3\times1} \\ \mathbf{0}_{1\times3} & 0 \end{bmatrix} \begin{bmatrix} \mathbf{I}_{3\times3} & \mathbf{T}_{3\times1} \\ \mathbf{0}_{1\times3} & 0 \end{bmatrix}$$

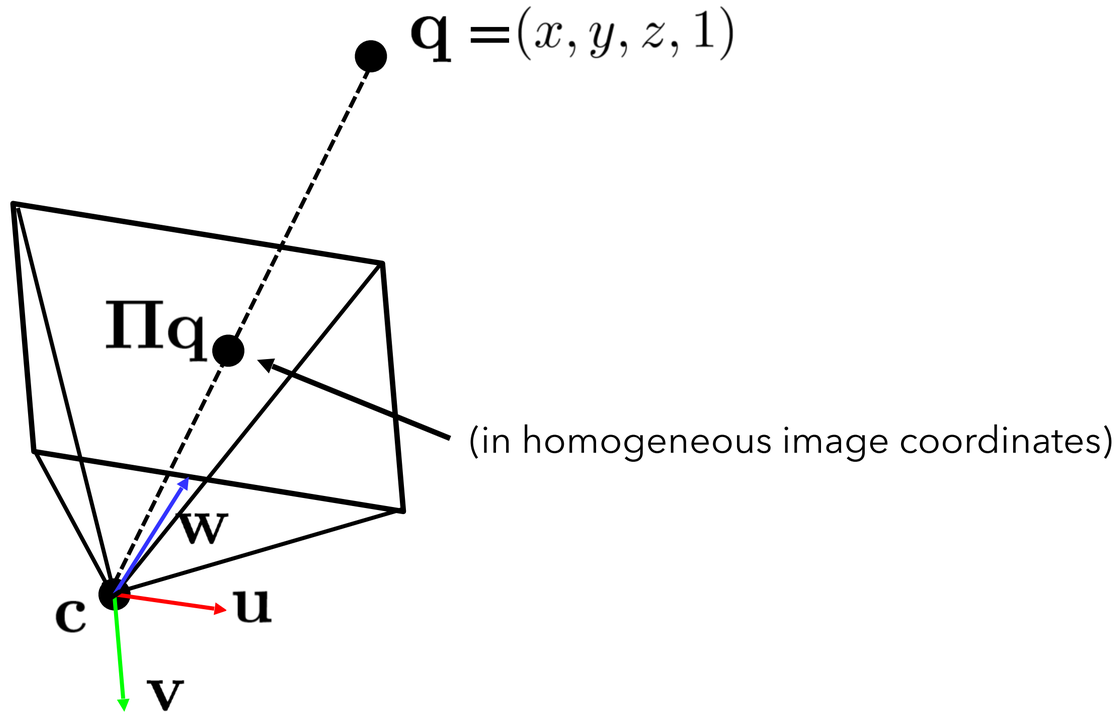
intrinsics | projection | rotation | translation

- The definitions of these parameters are **not** completely standardized

Source: N. Snavely

Projection matrix

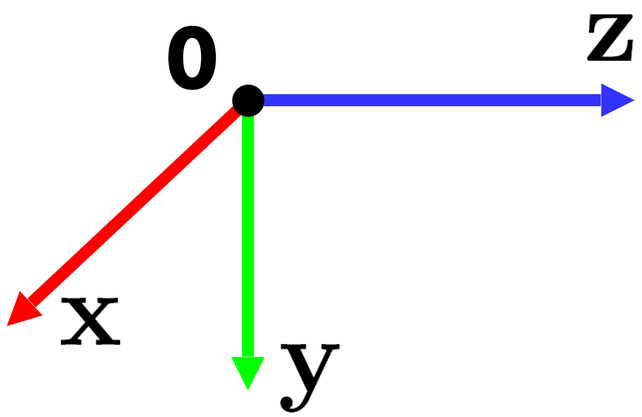




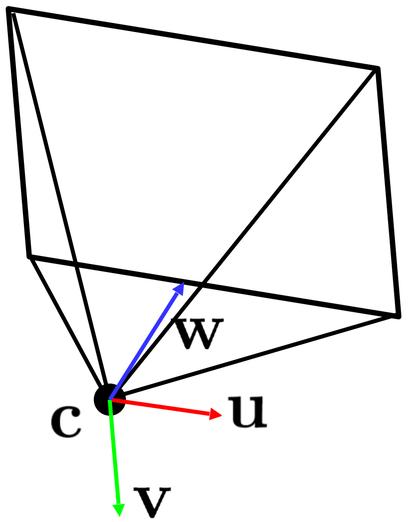
Source: N. Snavely

Extrinsics

- How do we get the camera to “canonical form”?
  (Center of projection at the origin, x-axis points right, y-axis points up, z-axis points backwards)



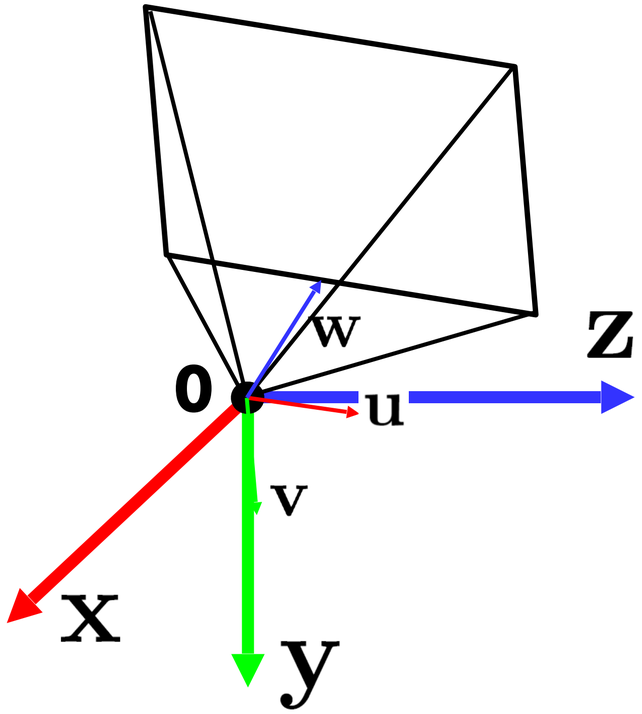
Step 1: Translate by -**c**



Source: N. Snavely

Extrinsics

- How do we get the camera to “canonical form”? (Center of projection at the origin, x-axis points right, y-axis points up, z-axis points backwards)



Step 1: Translate by -$\mathbf{c}$

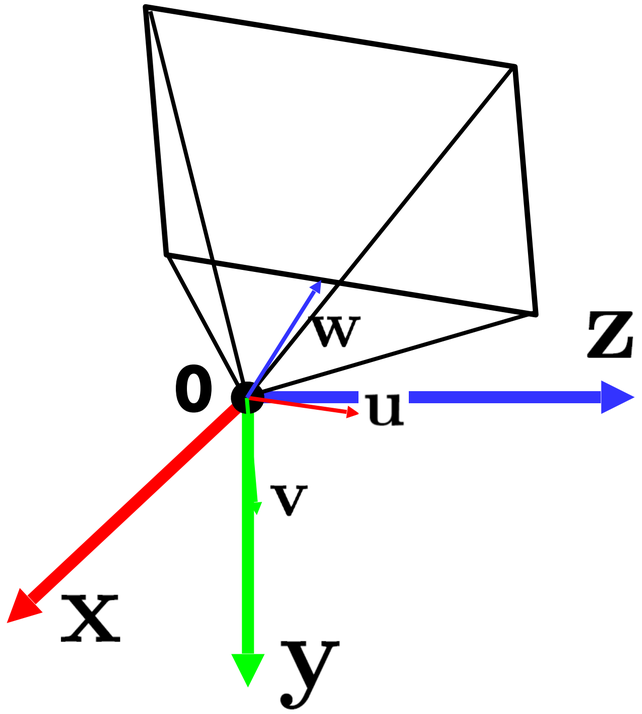
How do we represent translation as a matrix multiplication?

$$\mathbf{T} = \begin{bmatrix} \mathbf{I}_{3\times 3} & -\mathbf{c} \\ 0 \quad 0 \quad 0 & 1 \end{bmatrix}$$

Source: N. Snavely

Extrinsics

- How do we get the camera to “canonical form”? (Center of projection at the origin, x-axis points right, y-axis points up, z-axis points backwards)



Step 1: Translate by -**c**

Step 2: Rotate by **R**

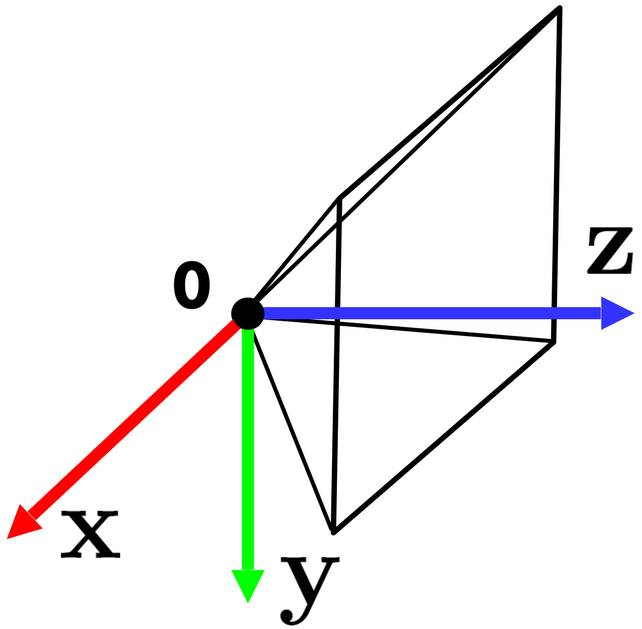
$$\mathbf{R} = \begin{bmatrix} \mathbf{u}^T \\ \mathbf{v}^T \\ \mathbf{w}^T \end{bmatrix}$$

3x3 rotation matrix

Source: N. Snavely

Extrinsics

- How do we get the camera to “canonical form”? (Center of projection at the origin, x-axis points right, y-axis points up, z-axis points backwards)



Step 1: Translate by -**c**

Step 2: Rotate by **R**

$$\mathbf{R} = \begin{bmatrix} \mathbf{u}^T \\ \mathbf{v}^T \\ \mathbf{w}^T \end{bmatrix}$$

(with extra row/column of [0 0 0 1])

Source: N. Snavely

Perspective projection

$$\underbrace{\begin{bmatrix} f & 0 & c_x \\ 0 & f & c_y \\ 0 & 0 & 1 \end{bmatrix}}_{\mathbf{K}} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

(intrinsics)

(converts from 3D rays in camera coordinate system to pixel coordinates)

$$\text{in general, } \mathbf{K} = \begin{bmatrix} f & s & c_x \\ 0 & \alpha f & c_y \\ 0 & 0 & 1 \end{bmatrix}$$

(upper triangular matrix)

α: **aspect ratio** (1 unless pixels are not square)

s : **skew** (0 unless pixels are shaped like rhombi/parallelograms)

(c_x, c_y): **principal point** ((w/2,h/2) unless optical axis doesn't intersect projection plane at image center)

Source: N. Snavely

Typical intrinsics matrix

$$\mathbf{K} = \begin{bmatrix} f & 0 & c_x \\ 0 & f & c_y \\ 0 & 0 & 1 \end{bmatrix}$$

- **2D affine transform** corresponding to a scale by f (focal length) and a translation by (c_x, c_y) (principal point)
- Maps 3D rays to 2D pixels

Source: N. Snavely

Focal length

- Can think of as "zoom"

24mm

50mm

200mm

800mm

- Also related to *field of view*

Source: N. Snavely

Changing focal length

Wide angle | Standard | Telephoto

Source: N. Snavely

http://petapixel.com/2013/01/11/how-focal-length-affects-your-subjects-apparent-weight-as-seen-with-a-cat/

Source: N. Snavely

Projection matrix

$$\mathbf{\Pi} = \mathbf{K} \underbrace{\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}}_{\text{projection}} \underbrace{\begin{bmatrix} & \mathbf{R} & & \begin{matrix} 0 \\ 0 \\ 0 \end{matrix} \\ 0 & 0 & 0 & 1 \end{bmatrix}}_{\text{rotation}} \underbrace{\begin{bmatrix} & \mathbf{I}_{3\times 3} & & -\mathbf{c} \\ 0 & 0 & 0 & 1 \end{bmatrix}}_{\text{translation}}$$

intrinsics

The **K** matrix converts 3D rays in the camera's coordinate system to 2D image points in image (pixel) coordinates.

This part converts 3D points in world coordinates to 3D rays in the camera's coordinate system. There are 6 parameters represented (3 for position/translation, 3 for rotation).

Source: N. Snavely

Projection matrix

$$\mathbf{\Pi} = \mathbf{K} \underbrace{\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}}_{\text{projection}} \underbrace{\begin{bmatrix} & \mathbf{R} & & \begin{matrix} 0 \\ 0 \\ 0 \end{matrix} \\ 0 & 0 & 0 & 1 \end{bmatrix}}_{\text{rotation}} \underbrace{\begin{bmatrix} & \mathbf{I}_{3\times 3} & & -\mathbf{c} \\ 0 & 0 & 0 & 1 \end{bmatrix}}_{\text{translation}}$$

intrinsics

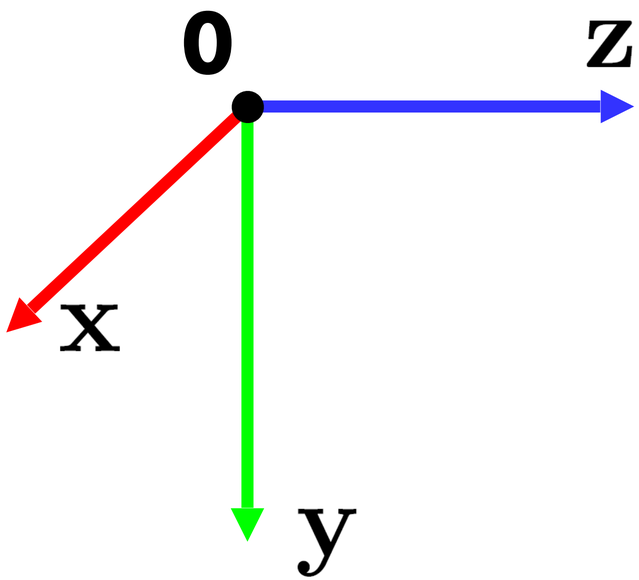
$$\begin{bmatrix} \mathbf{R} & \underbrace{-\mathbf{R}\mathbf{c}} \end{bmatrix}$$

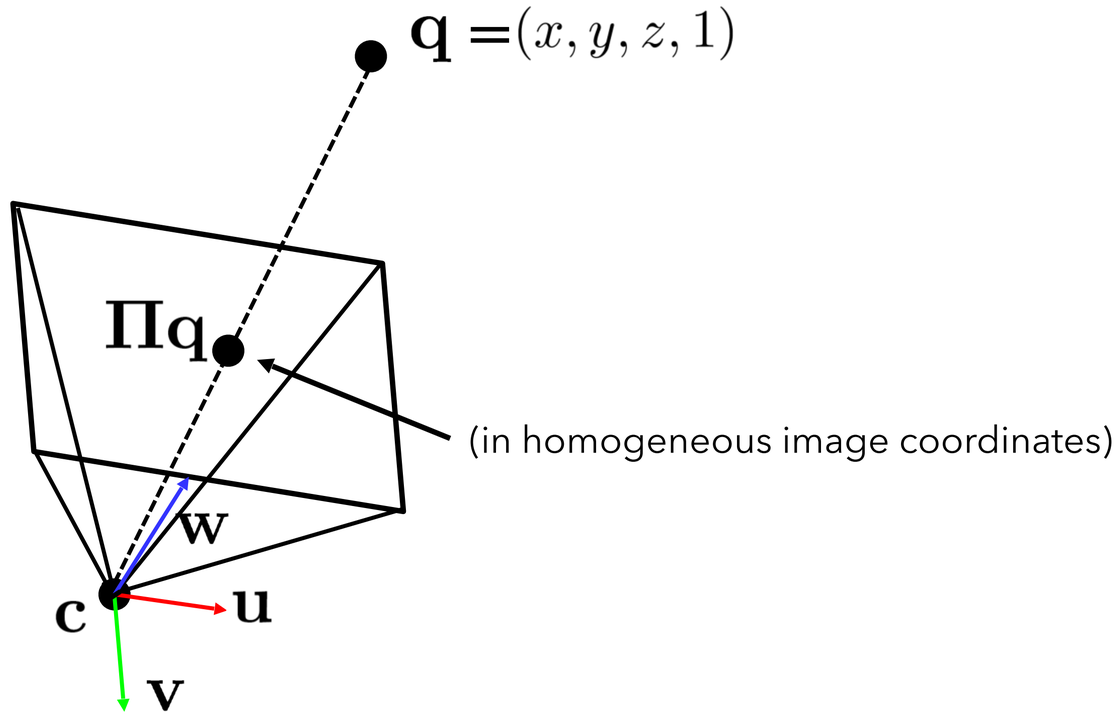
(sometimes called **t**)

$$\mathbf{\Pi} = \mathbf{K} \begin{bmatrix} \mathbf{R} & -\mathbf{R}\mathbf{c} \end{bmatrix}$$

Source: N. Snavely

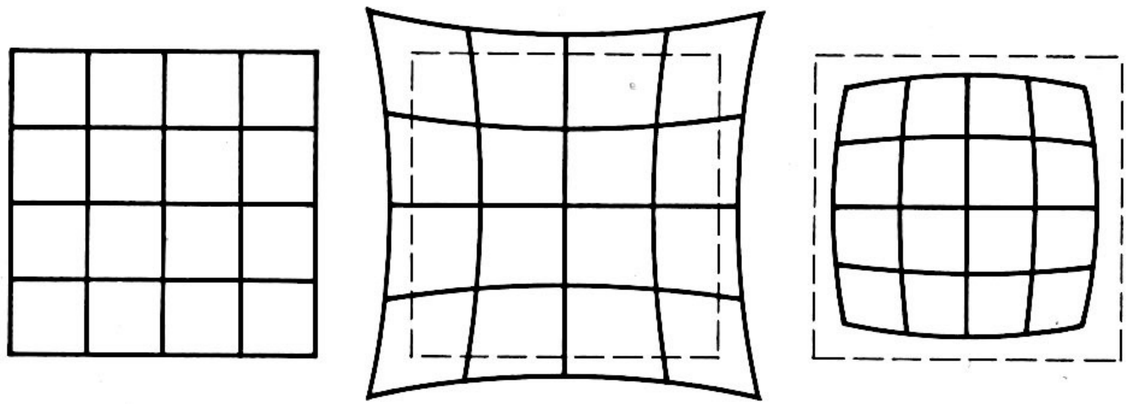
Projection matrix





Source: N. Snavely

Distortion



- Radial distortion of the image
  - Caused by imperfect lenses
  - Deviations are most noticeable for rays that pass through the edge of the lens

Source: N. Snavely

Source: N. Snavely

Modeling distortion

$(\hat{x}, \hat{y}, \hat{z})$

Project to "normalized" image coordinates

$$x'_n = \hat{x}/\hat{z}$$
$$y'_n = \hat{y}/\hat{z}$$

$$r^2 = {x'_n}^2 + {y'_n}^2$$

Apply radial distortion

$$x'_d = x'_n(1 + \kappa_1 r^2 + \kappa_2 r^4)$$
$$y'_d = y'_n(1 + \kappa_1 r^2 + \kappa_2 r^4)$$

Apply focal length translate image center

$$x' = f x'_d + x_c$$
$$y' = f y'_d + y_c$$

- To model lens distortion
  - Use above projection operation instead of only standard projection matrix multiplication

Source: N. Snavely

Correcting radial distortion

from Helmut Dersch

Next class: More geometry!