# Lecture 12: Photographic Optics

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#### CSC 259/459, Fall 2024 **Computer Imaging & Graphics**



#### The Roadmap

#### **Theoretical Preliminaries**

#### Human Visual Systems

#### **Digital Camera Imaging**

#### **Modeling and Rendering**

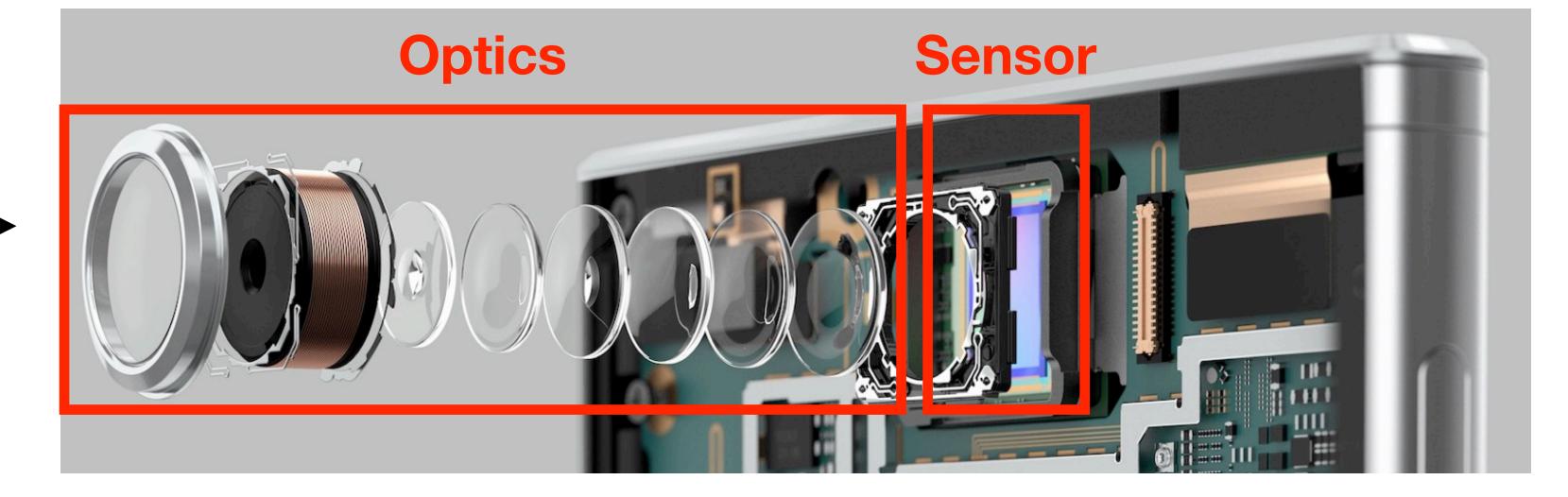
#### **Photographic Optics**

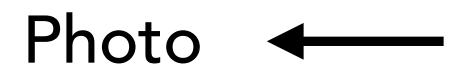
Image Sensor Image Signal Processing Image/Video Compression Immersive Content

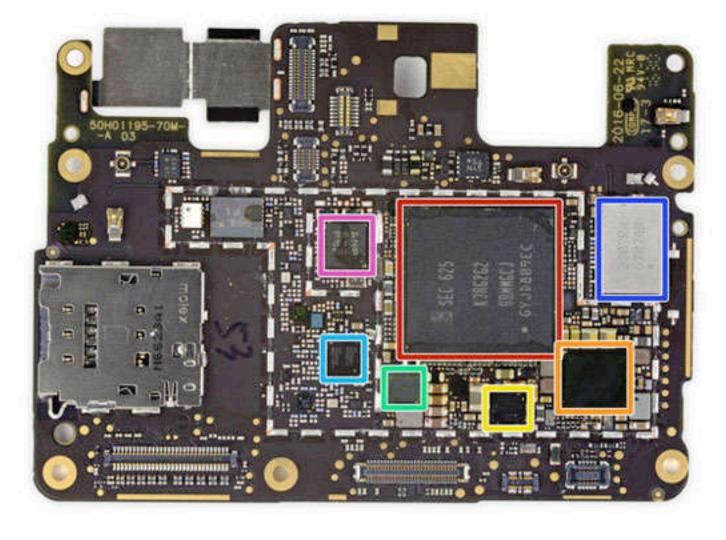


## **Digital Cameras**

Light –







https://ph.priceprice.com/Google-Pixel-XL-18713/news/Google-Pixel-XL-Repair-1939/



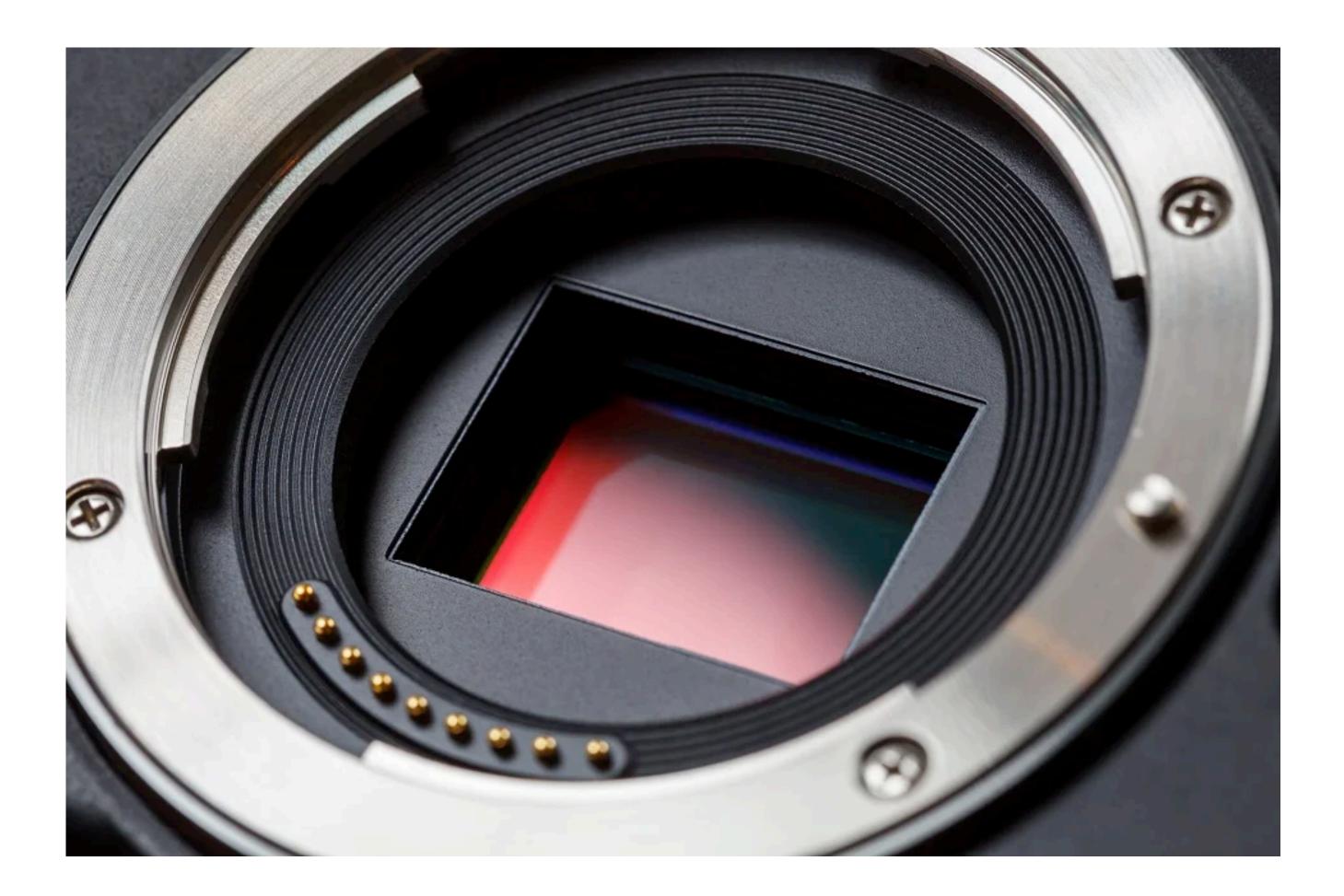
Image Signal Processing

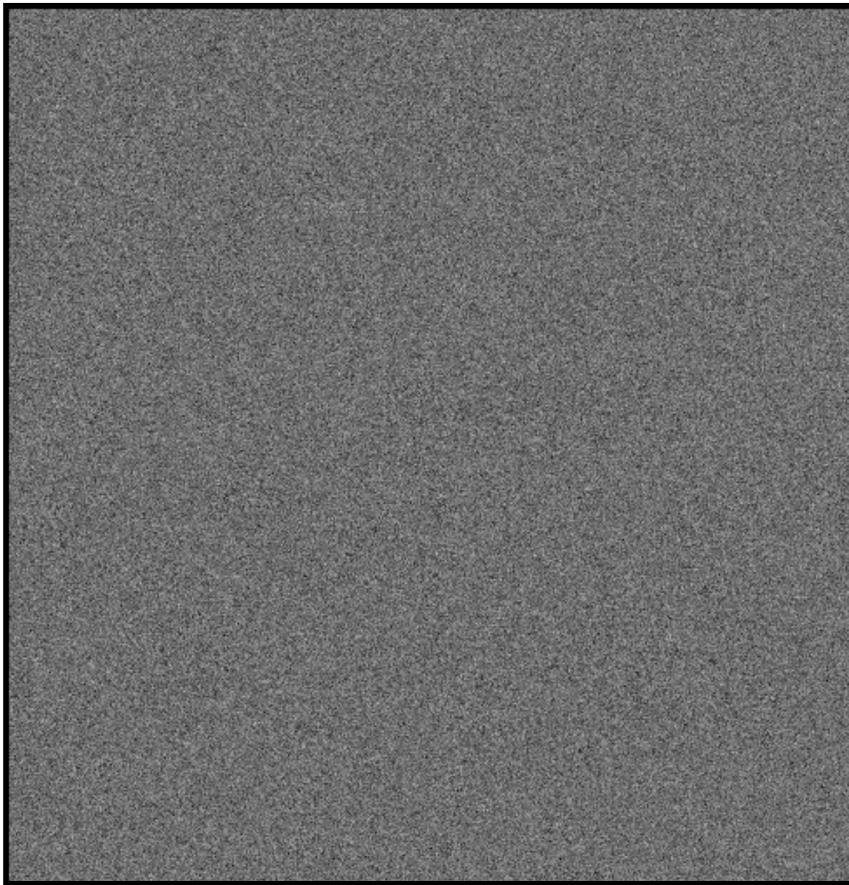


# Why Do Cameras Need Lenses Anyway?



#### Just Expose Sensor to Scene Without Optics





https://www.azosensors.com/article.aspx?ArticleID=1883

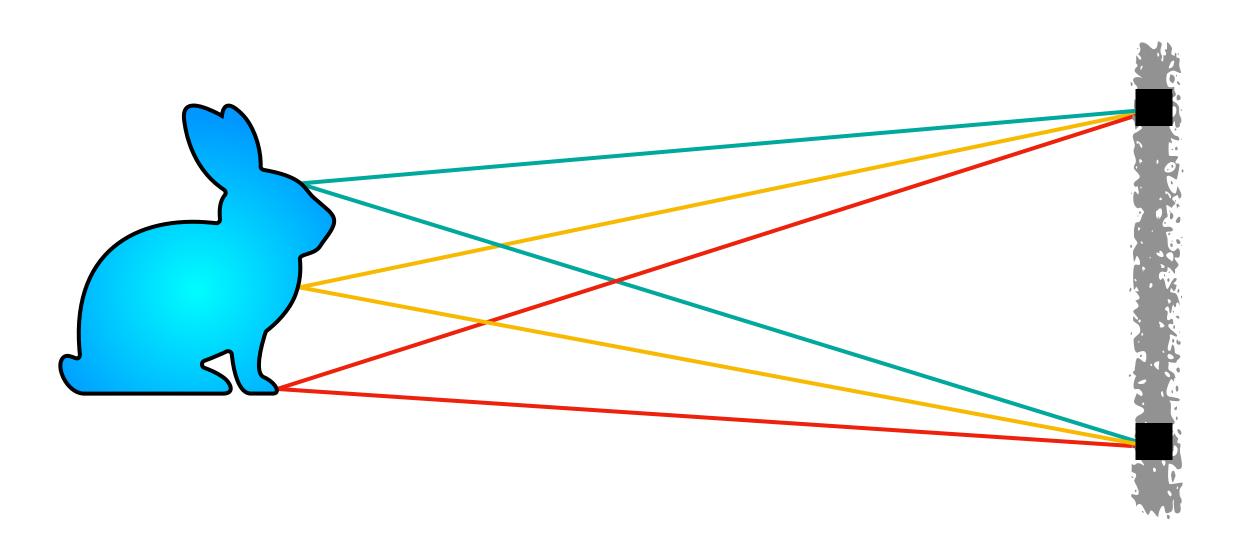




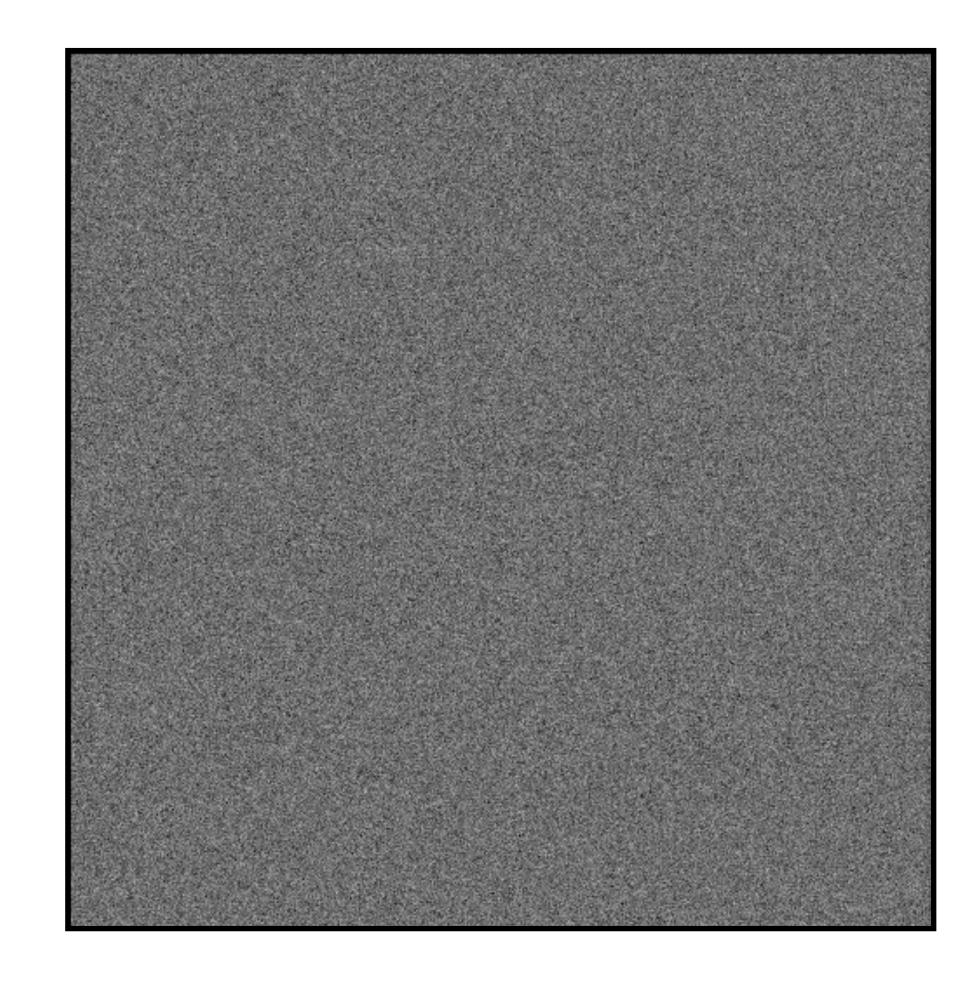


#### Just Expose Sensor to Scene Without Optics

Scene





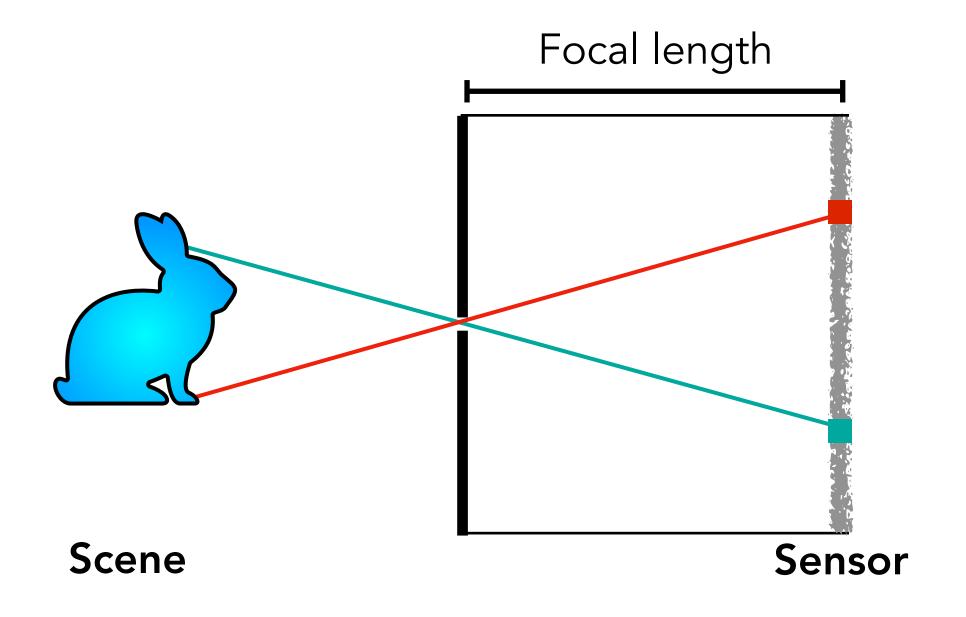




## **Pinhole Camera**

Ideally: Each pixel on the sensor gets light from only one scene point.

Use a very small hole as the aperture.



#### Pinhole size: 0.45mm Focal length:126mm

https://ondupinhole.com/products/8x10-giant-pinhole-camera



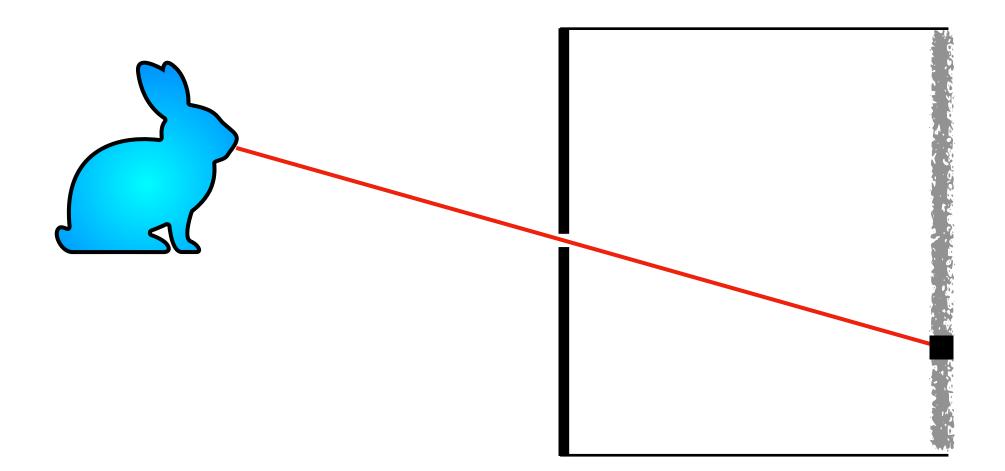
## Long Exposure Time

A small pinhole allows only very small amount of light to enter, requiring very long exposure time; impractical for many scenarios.

貒	Sunny	15 to 20 seconds
and the second s	Overcast	60 seconds
*	Cloudy	2 minutes
	Indoors	30 minutes to an hour
a	Nightime	A few hours



## Long Exposure Time Common Motion Blur



	Sunny	15 to 20 seconds
	Overcast	60 seconds
*	Cloudy	2 minutes
	Indoors	30 minutes to an hour
A	Nightime	A few hours



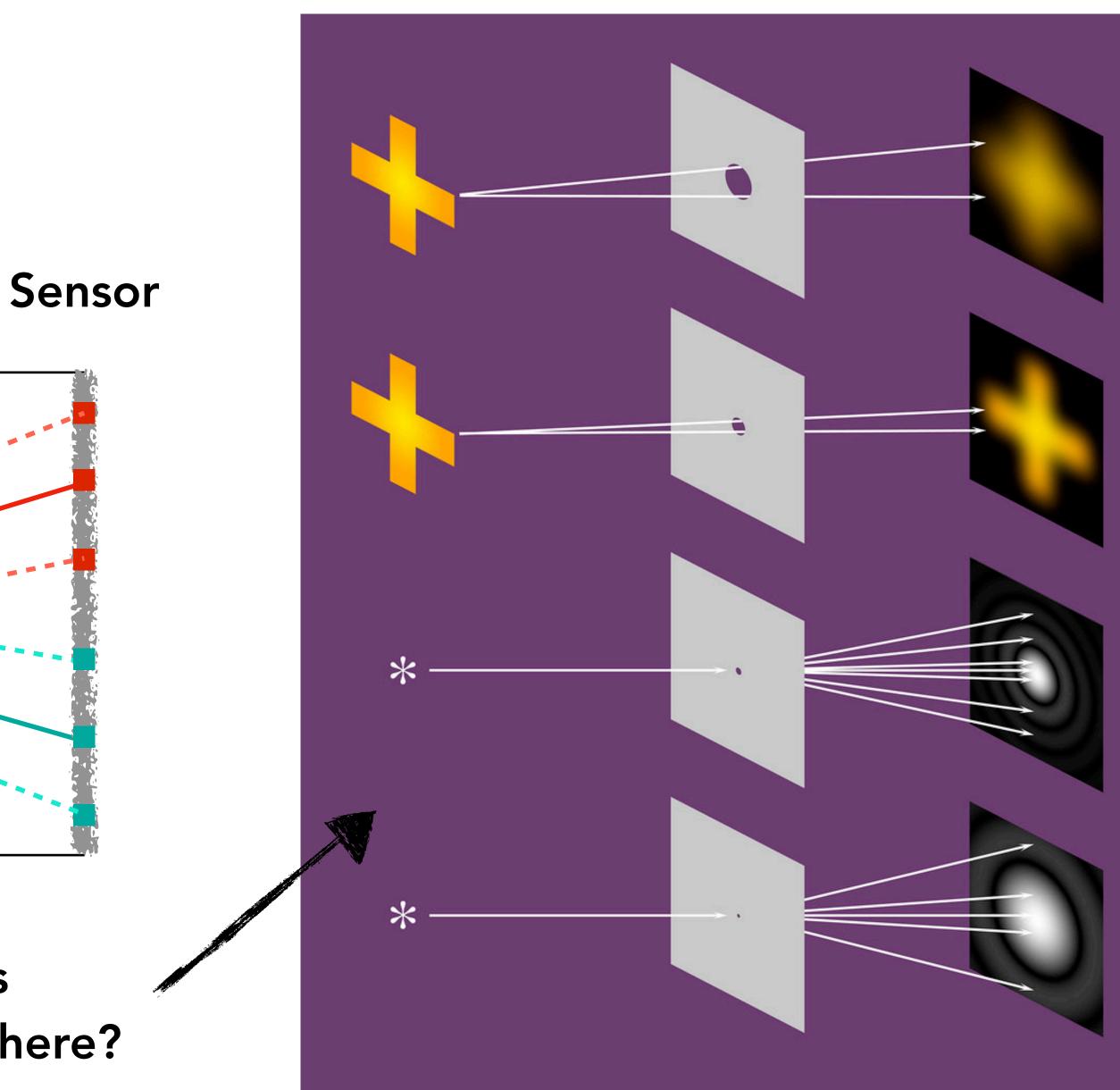


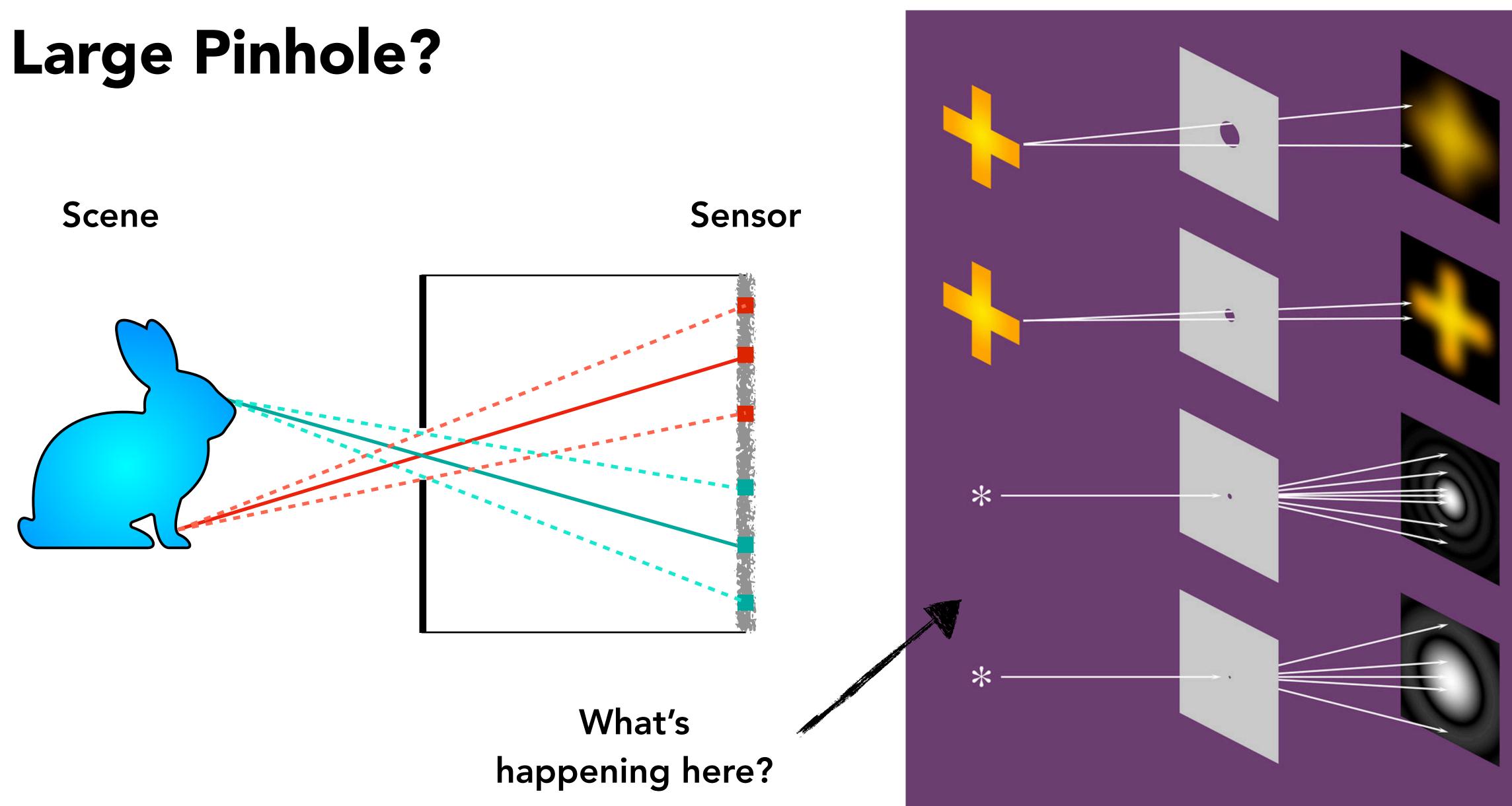
https://civilwar150pinholeproject.com/pinhole-cameras/ https://woub.org/2017/10/20/create-your-own-pinhole-camera-at-daco-with-artist-daniel-king/









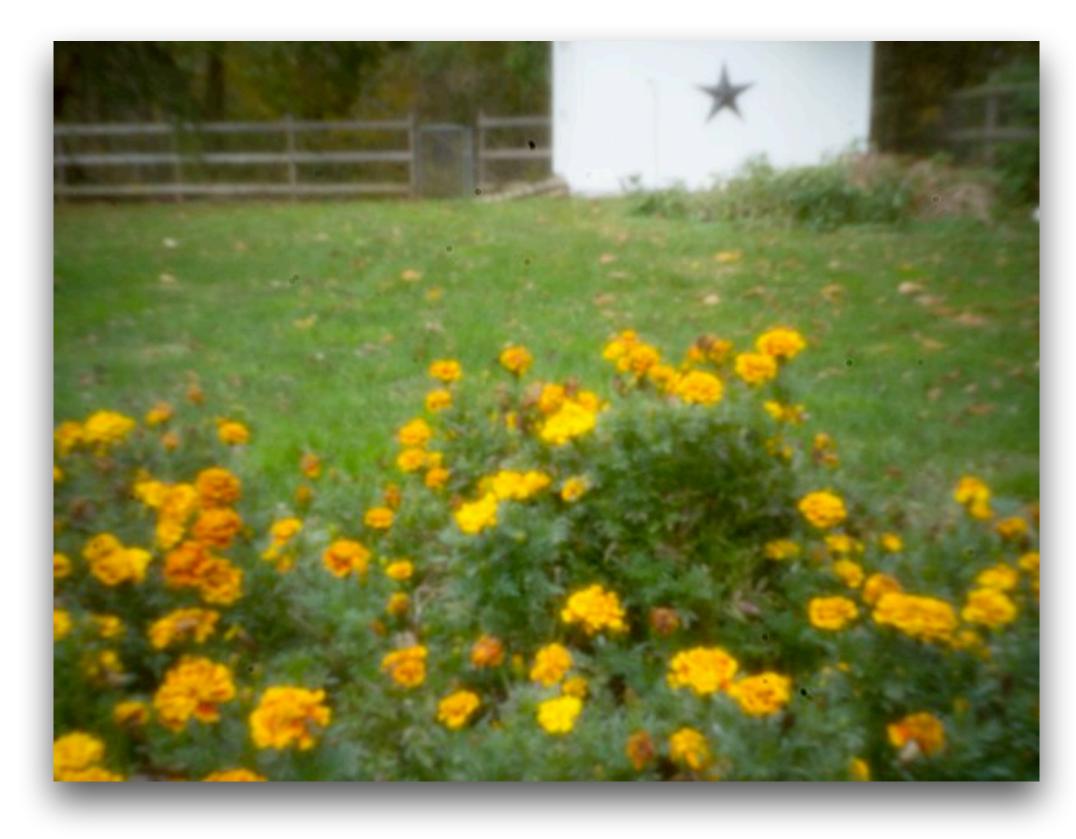


https://www.flickr.com/photos/dominicspics/4589206921 11



# Not All Blurs Are Created Equal

Blur From Large Aperture ("Defocus" Blur)



https://www.quora.com/Why-do-pinhole-camera-images-lose-image-clarity-when-the-aperture-size-is-increased

#### **Motion Blur**



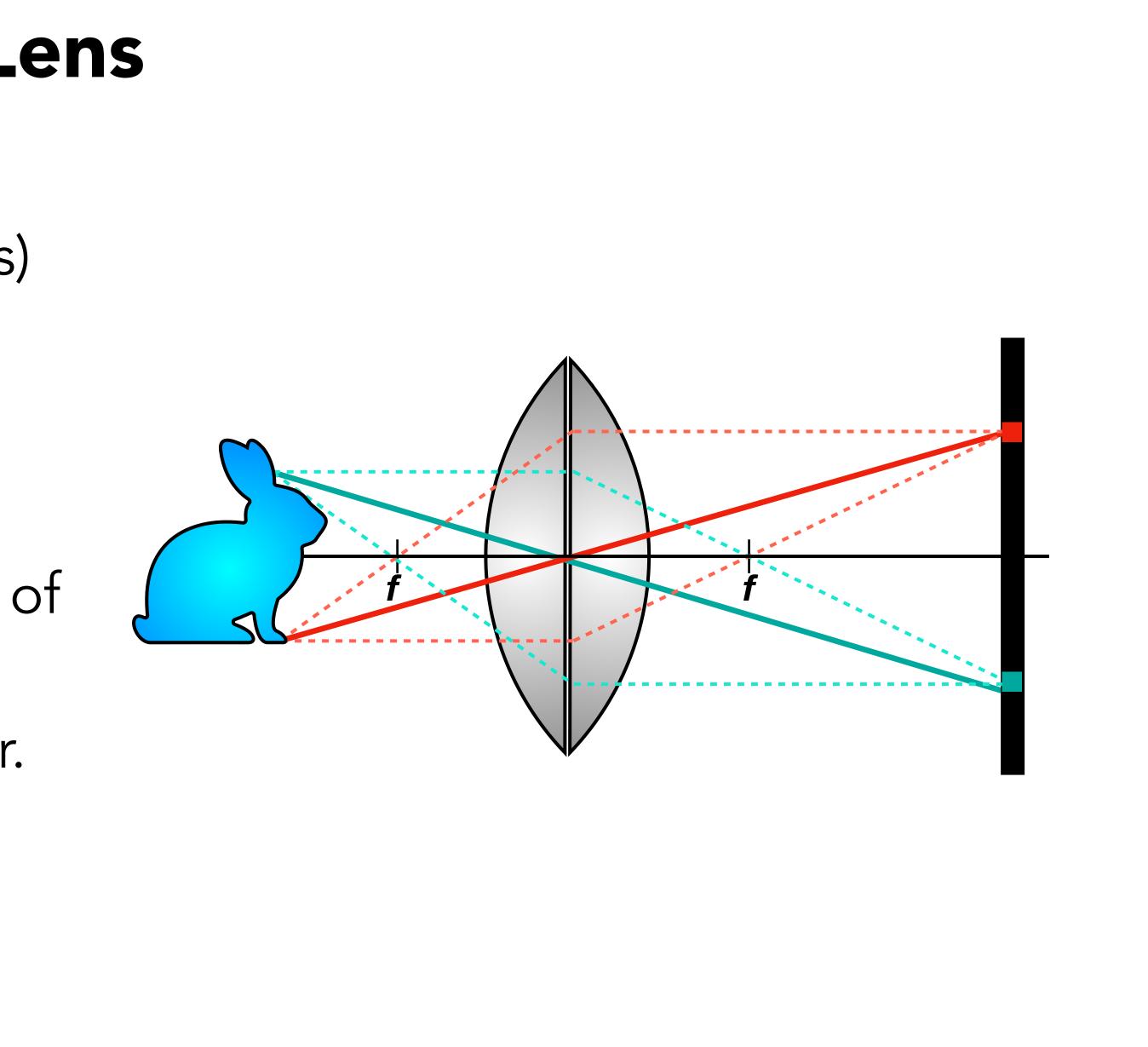


# Imaging With a Convex Lens

A point in the scene emits (or reflects) rays in all directions.

• A pinhole camera captures just one ray from the point.

A convex lens captures/focuses a lot of rays from the same point and sends them to the same pixel on the sensor.



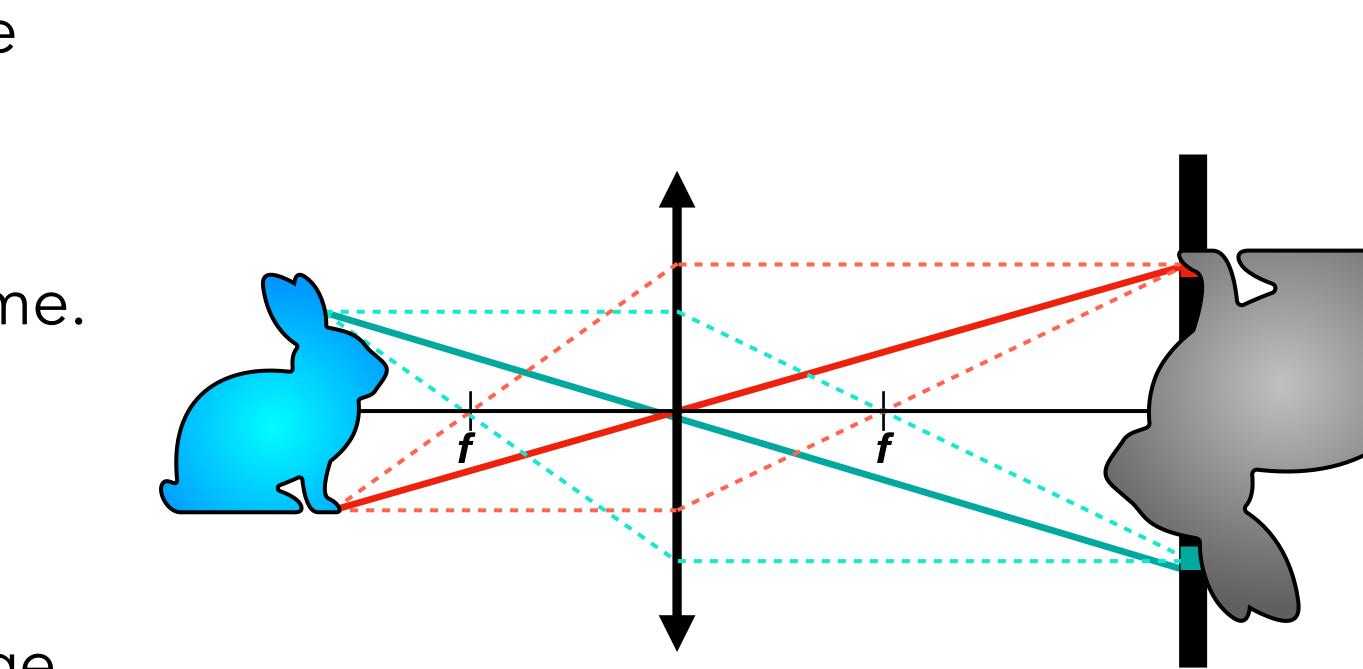
13

# The Image is the Same As With a Pinhole Camera

If in focus, the captured image is the geometrically the same as the one captured by a pinhole camera, but brighter given the same exposure time.

- ... under the thin lens and paraxial approximations (later)
- Both are **perspective projection**

This's why we can **approximate** image formation process of a lens-based camera using a pinhole camera model.

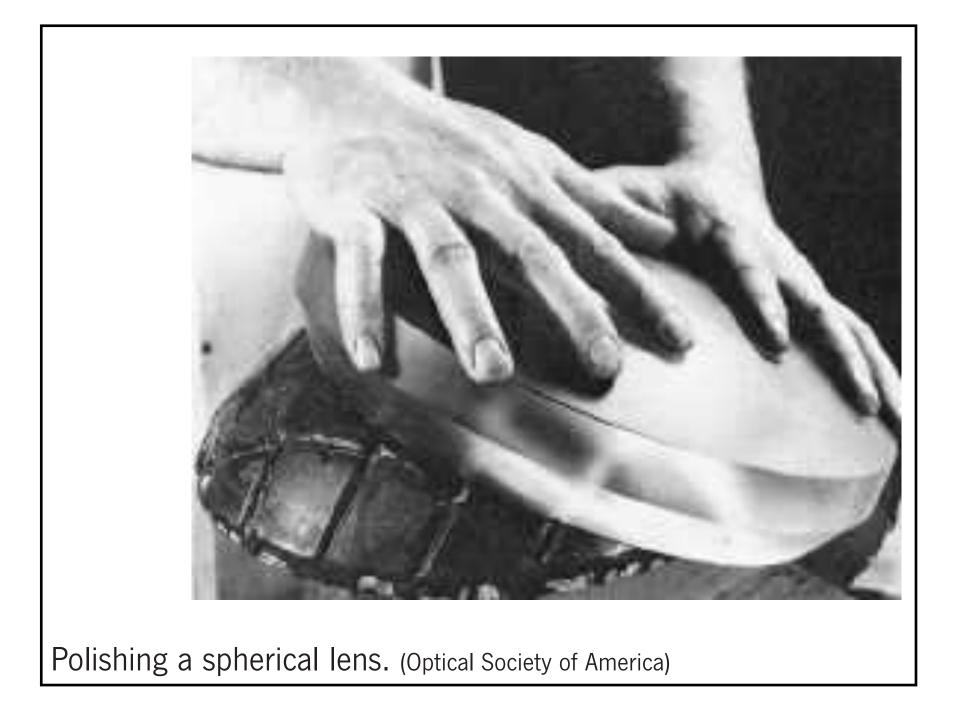




# Making Convex Lens



#### The simplest way: combining two spherical lenses, which are easy to make.



https://en.wikipedia.org/wiki/Lens Optics, Hecht, 5ed 15

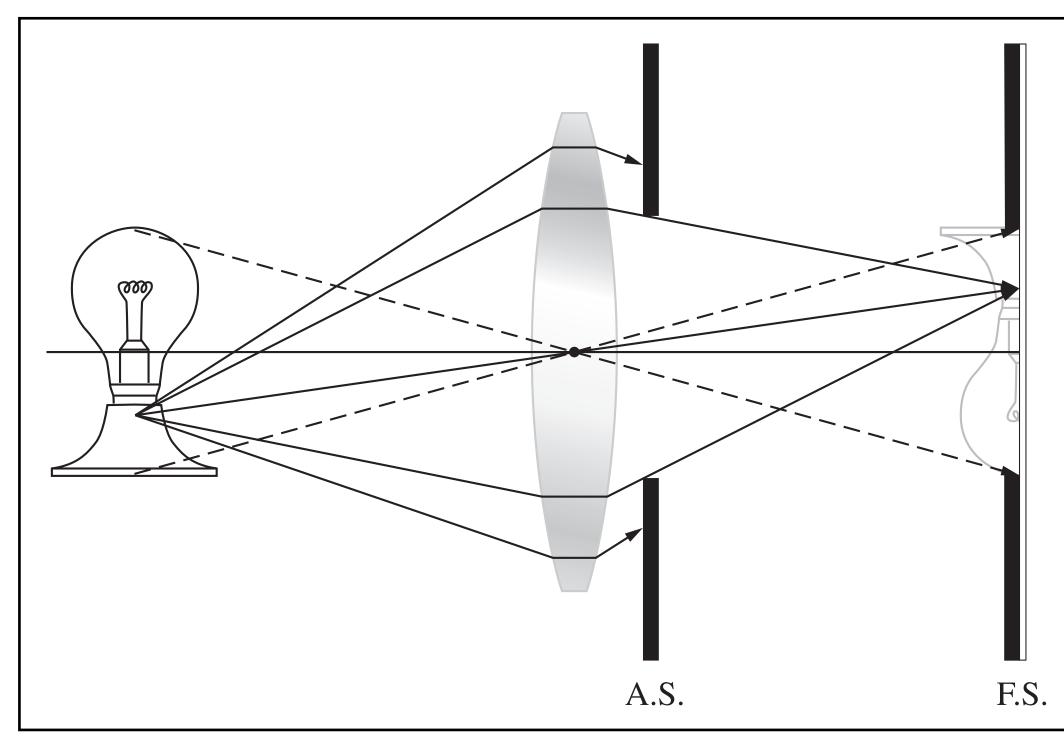


#### Aperture

Aperture limits the amount of light that pass through the lens.

Amount of photons allowed through is proportional to the aperture area (radius<sup>2</sup>)

Aperture size has implications on exposure time, motion blur, and depth of field (more on this later).





## Shutter

Shutter controls how sensor is exposed to light Mechanical shutter:

- Sensor is **unexposed** to light normally
- Shutter mechanically opens to expose sensor to light
- Shutter open size dictates exposure time
- Focal plane shutter is common these days; inherently a rolling shutter

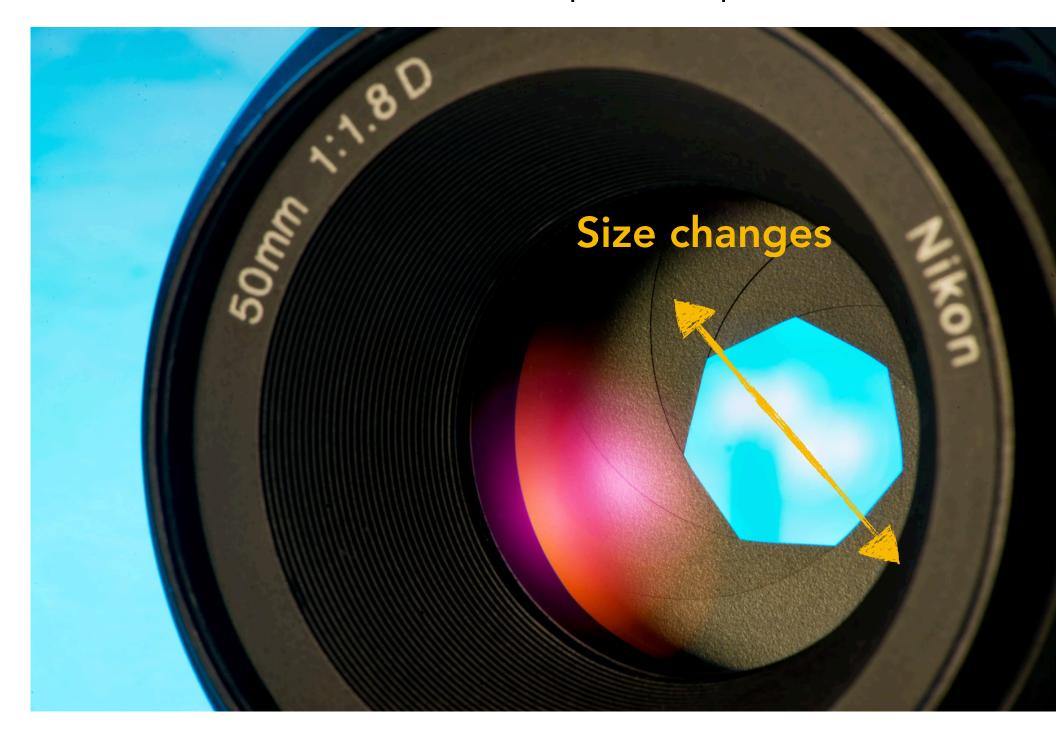
Electronic shutter (next lecture):

- Sensor is always **exposed** to light
- The pixel circuit resets/drains a pixel's charges to prepare for a capture
- Can be either rolling or global shutter



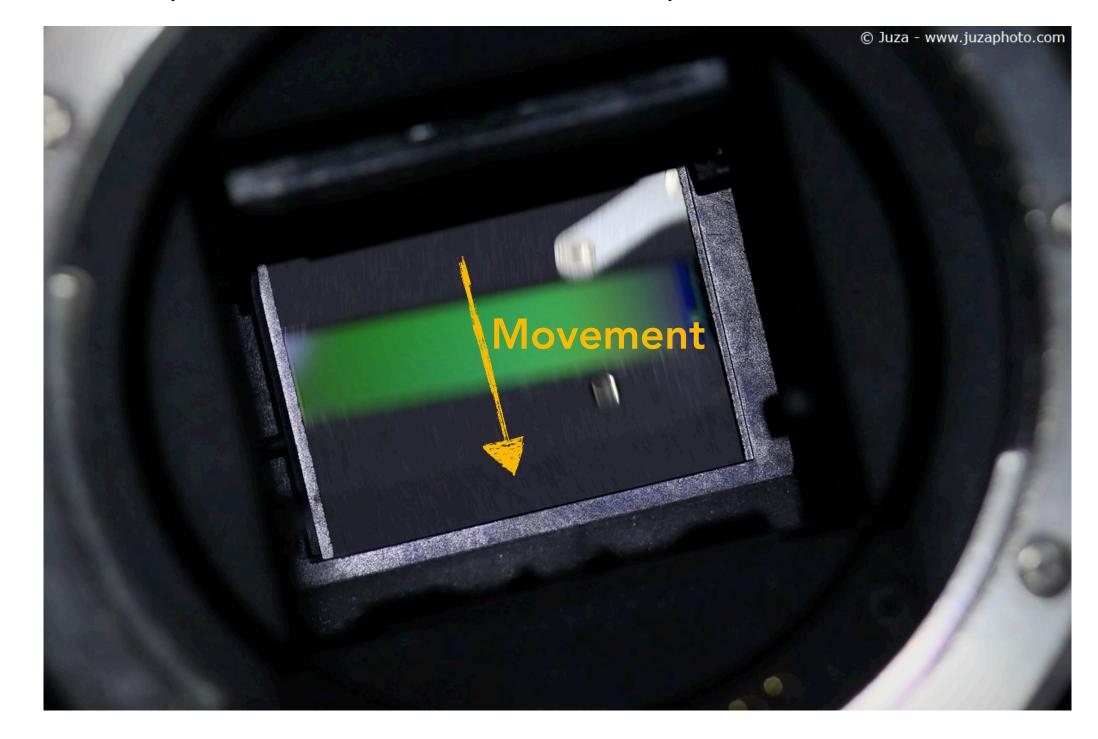
# **Mechanical Shutter**

Leaf shutter (usually at the aperture plane)



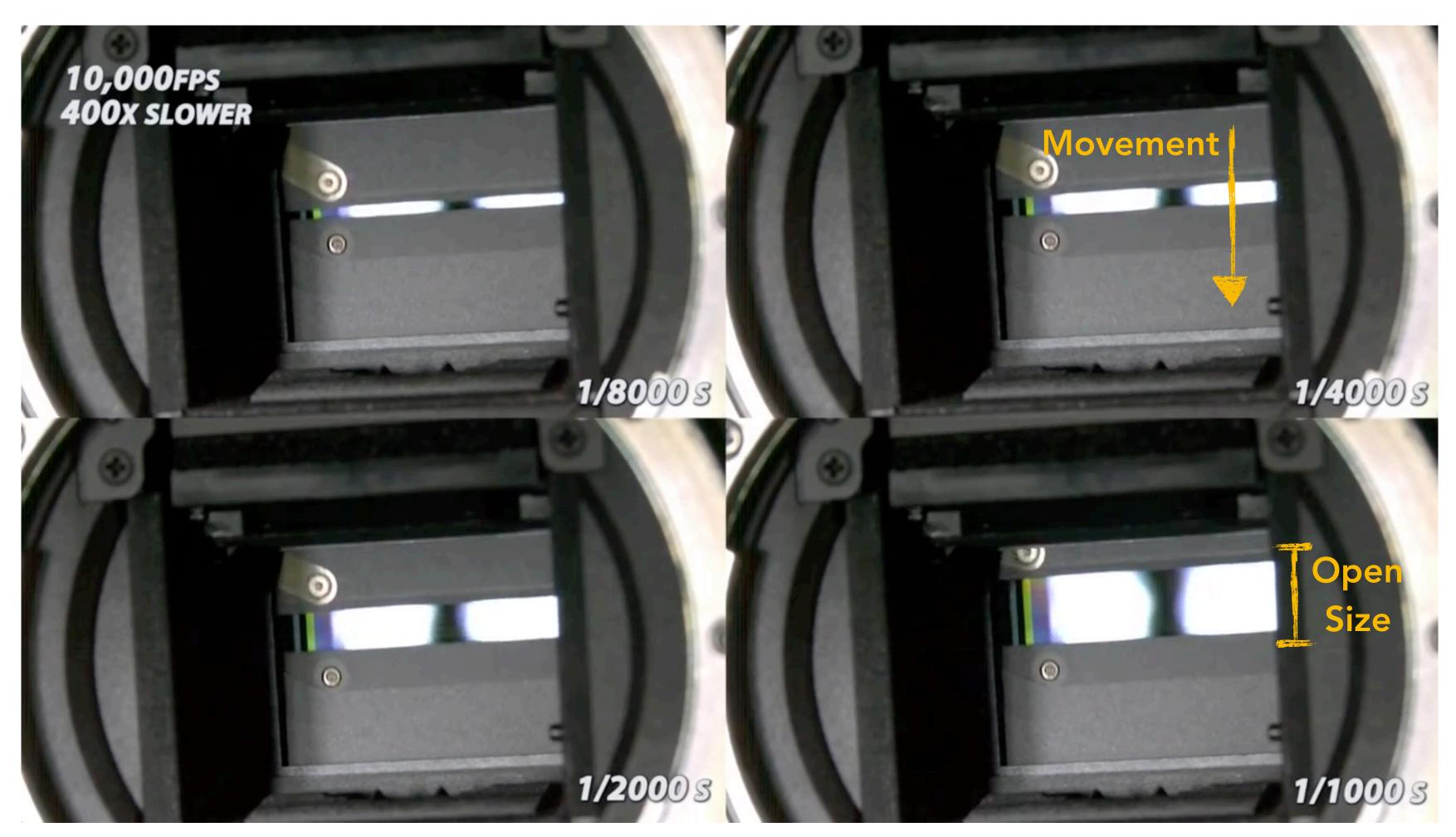
https://newatlas.com/aperture-camera-photography-guide/47388/ https://www.juzaphoto.com/article.php?l=it&t=mechanical\_and\_electronic\_shutter 18

#### Focal plane shutter (at the focal plane)





#### Focal Plane Shutter (Fast Exposures)



The Slow Mo Guys, <a href="https://youtu.be/CmjeCchGRQo">https://youtu.be/CmjeCchGRQo</a>

CS184/284A

Inherently a rolling shutter

Exposure time is dictated by the shutter open size

Kanazawa & Ng







# Modeling Lens Behaviors

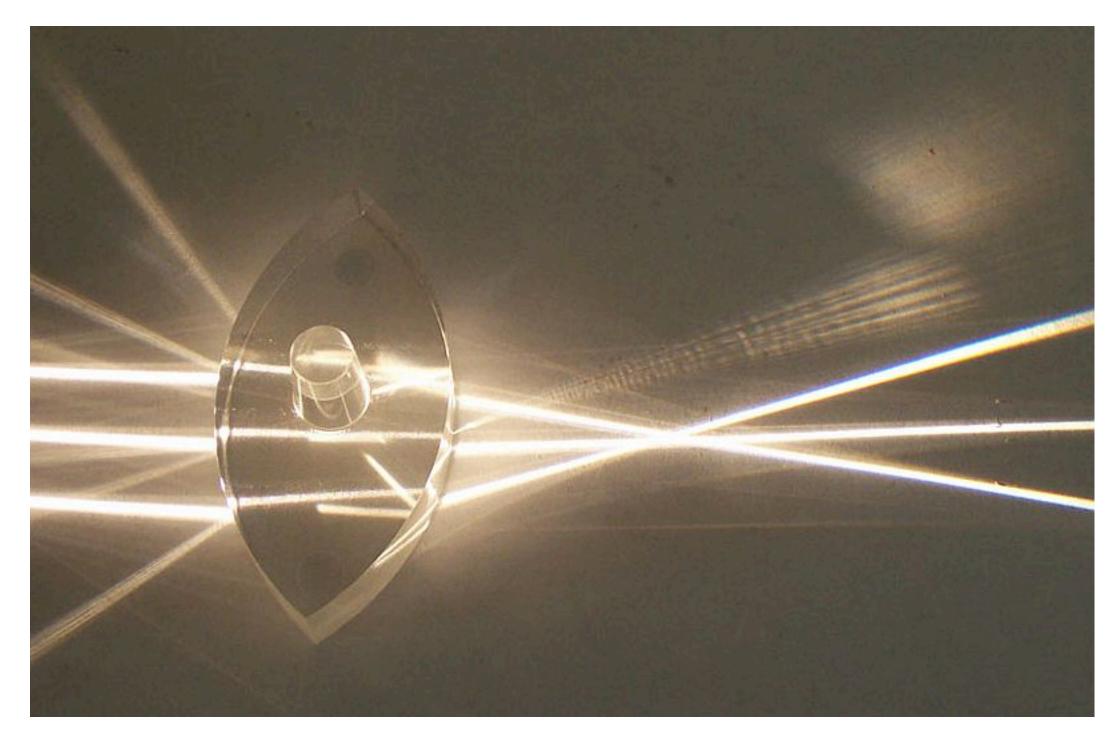


# Why Does Convex Lens Focus Light?

Lenses don't magically bend lights.

Lights change direction going through media of different refractive indices.

- Air to glass and glass to air again here.
- Again, lights changing direction at medium interface is macroscopic behavior of particles scattering photons with interference.



https://en.wikipedia.org/wiki/Lens 21



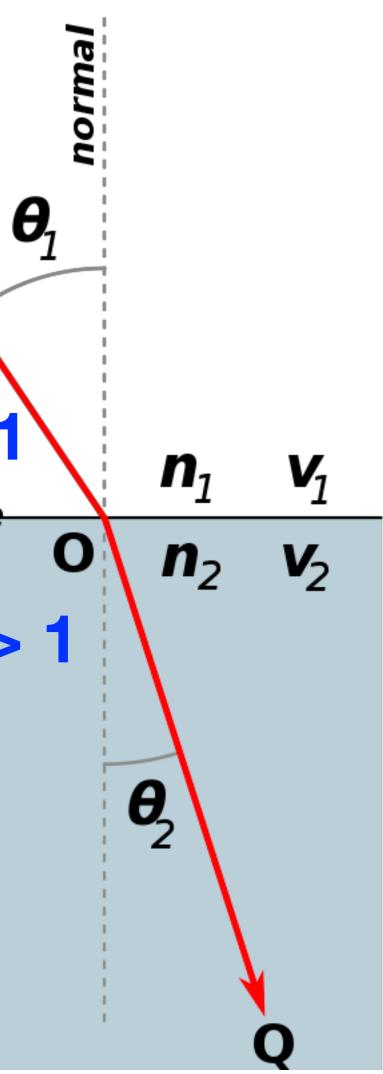
#### Snell's Law

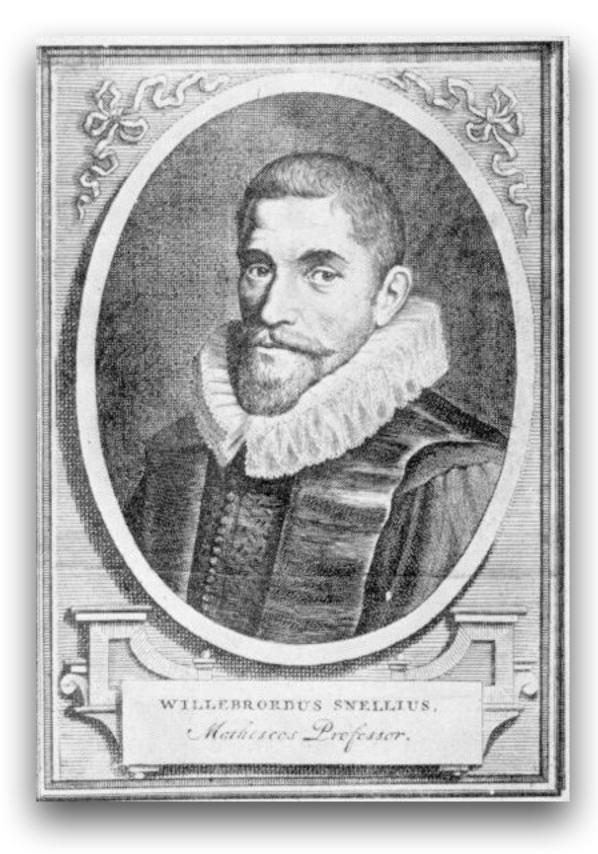
#### $n_1 \sin \theta_1 = n_2 \sin \theta_2$

Nair ~ 1 interface

Ρ

n<sub>glass</sub> > 1





"Snel has his name mis-spelled for a couple hundred years now."

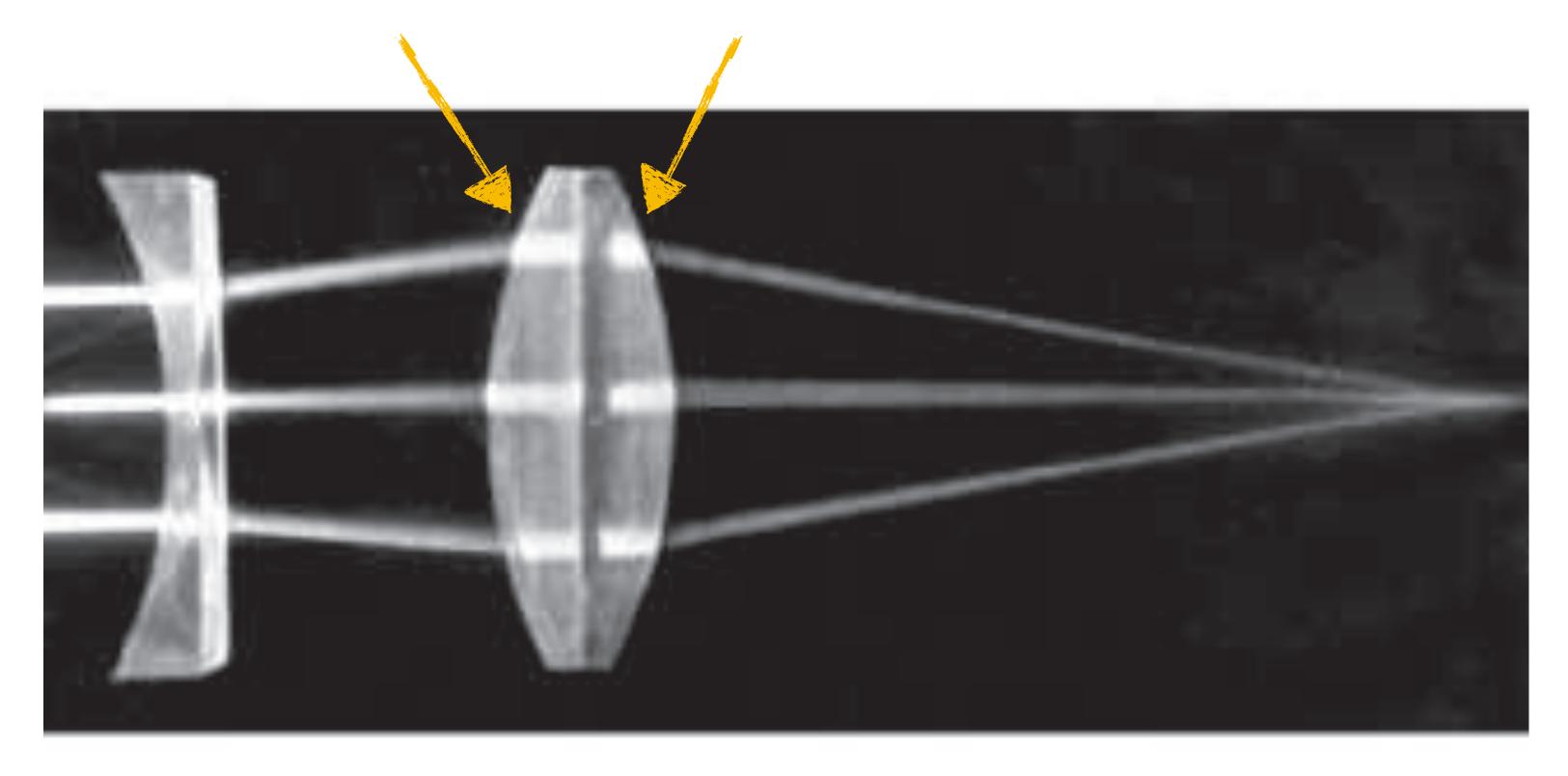
https://en.wikipedia.org/wiki/Snell%27s\_law 22





### **Snell's Law in Action**

#### First Interface Second Interface



Optics, Hecht, 5ed 23

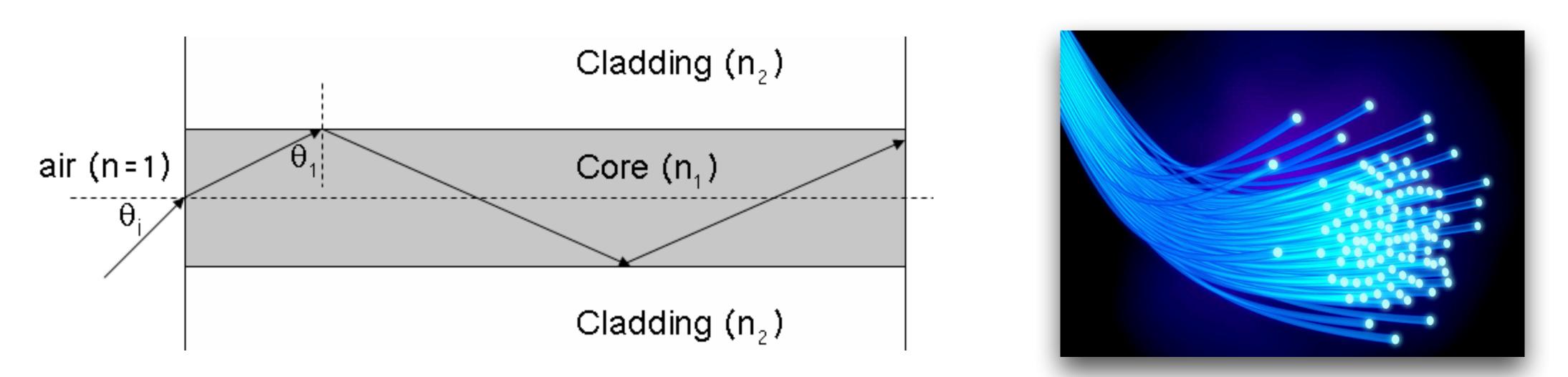




# Waveguide

no refraction, and we get "total internal reflection."

~how optical fibers work.

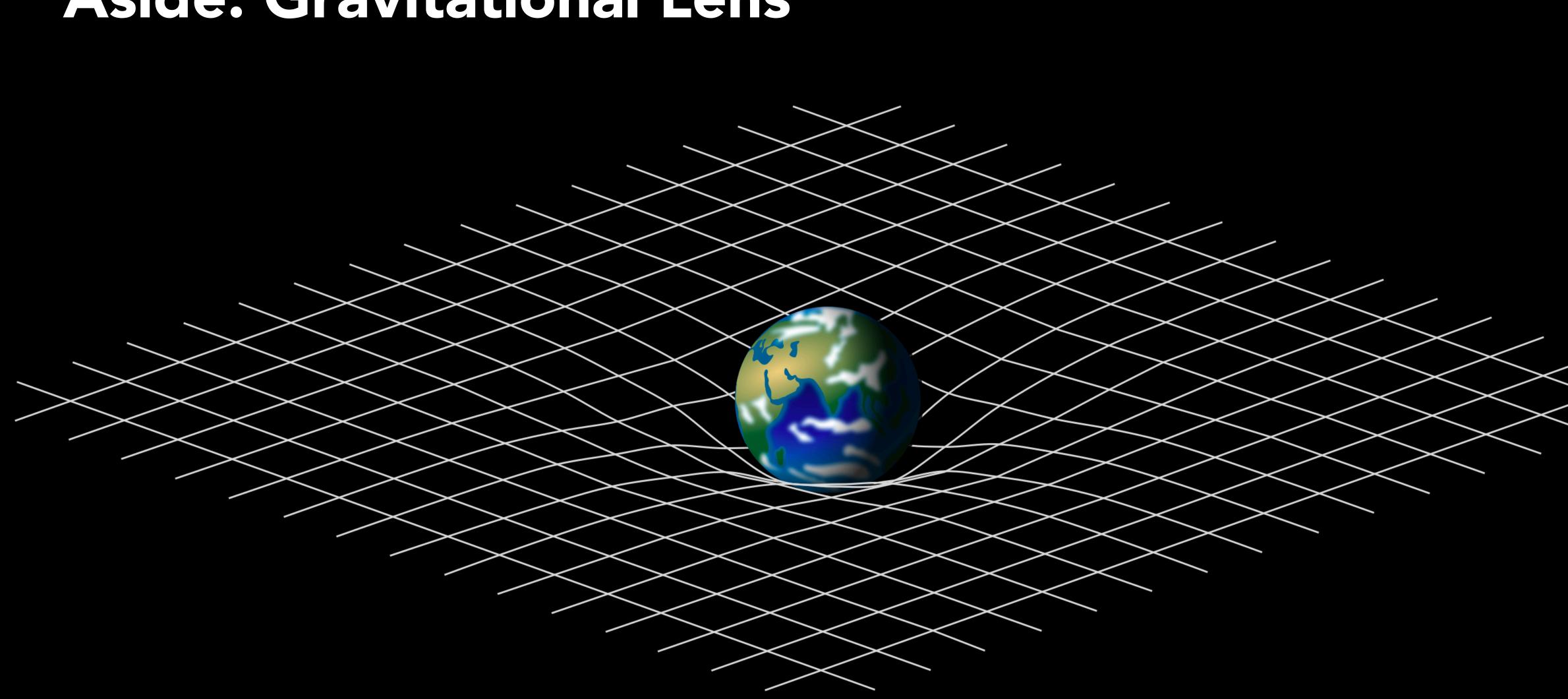


https://www.researchgate.net/figure/Light-propagation-in-a-waveguide-due-to-total-internal-reflection\_fig14\_274666441 https://www.tutorialspoint.com/principles\_of\_communication/principles\_of\_optical\_fiber\_communications.htm

# When lights goes from glass to air and when $\theta_1$ is large enough, there will be



#### Aside: Gravitational Lens



https://en.wikipedia.org/wiki/Gravitational\_lens 25





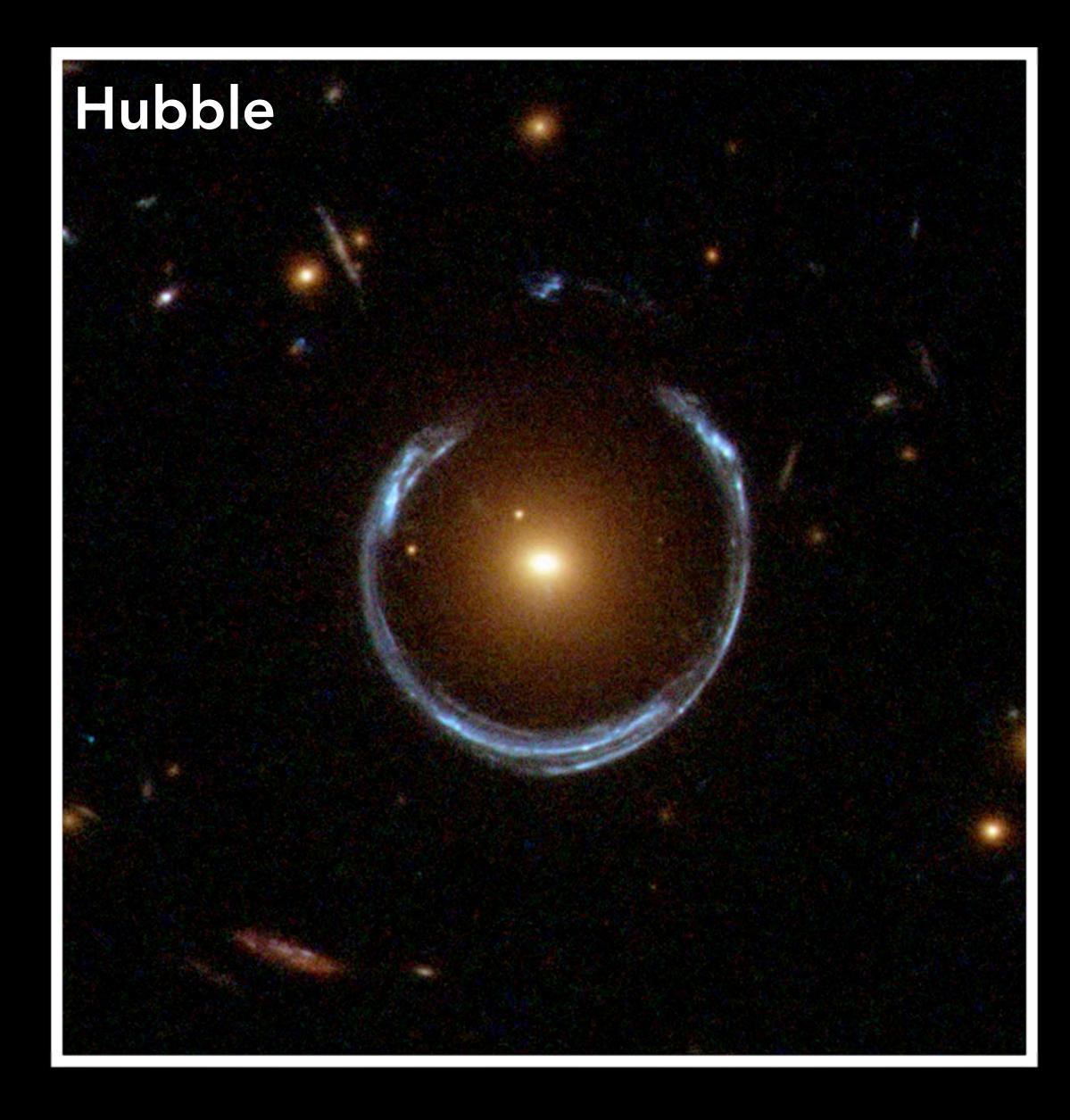
### Aside: Gravitational Lens



# -GALAX-Y-CLUSTER

https://newatlas.com/space/james-webb-space-telescope-gravitational-lensing/ 26





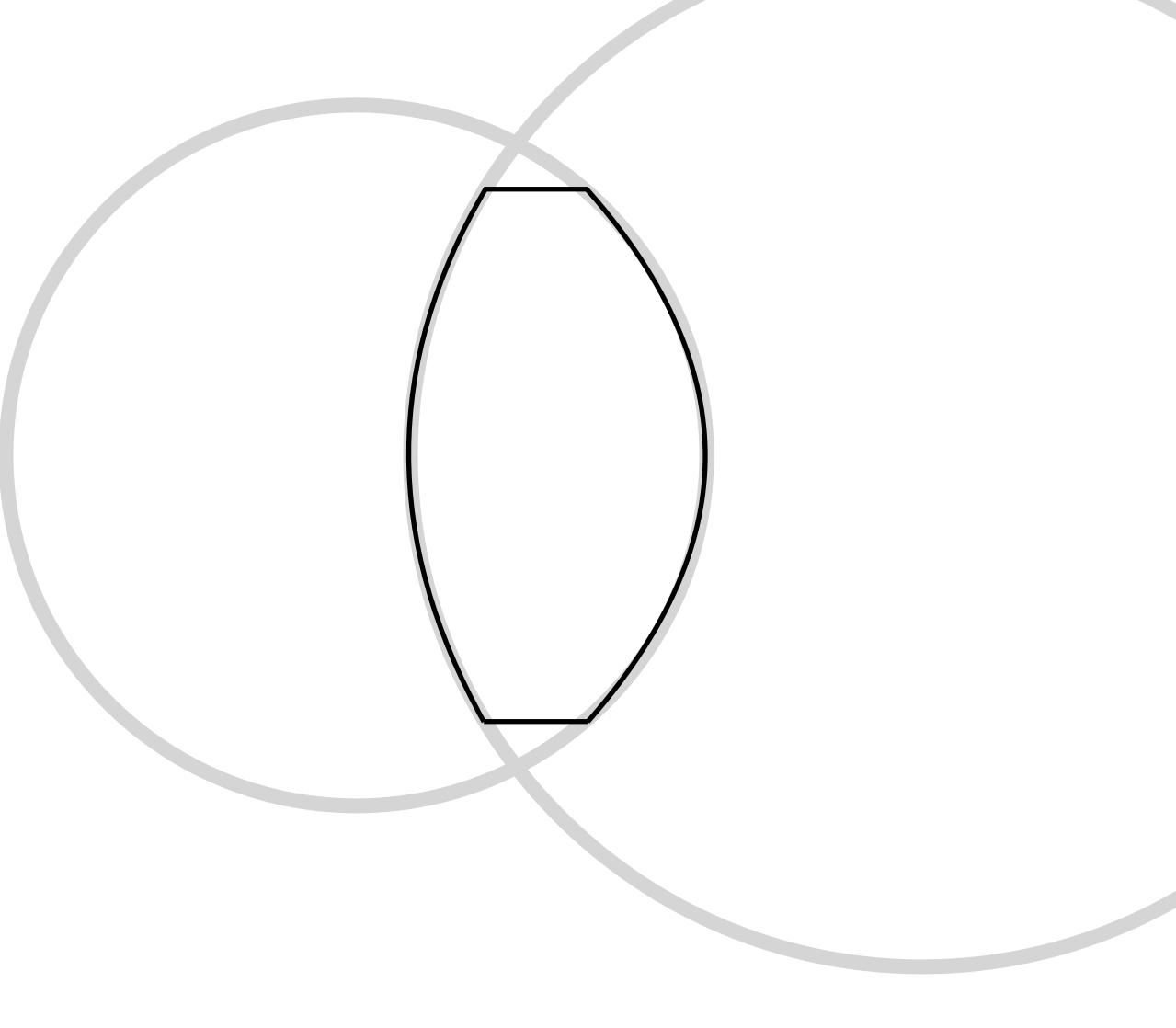
https://newatlas.com/space/james-webb-space-telescope-gravitational-lensing/



https://hubblesite.org/contents/articles/gravitational-lensing

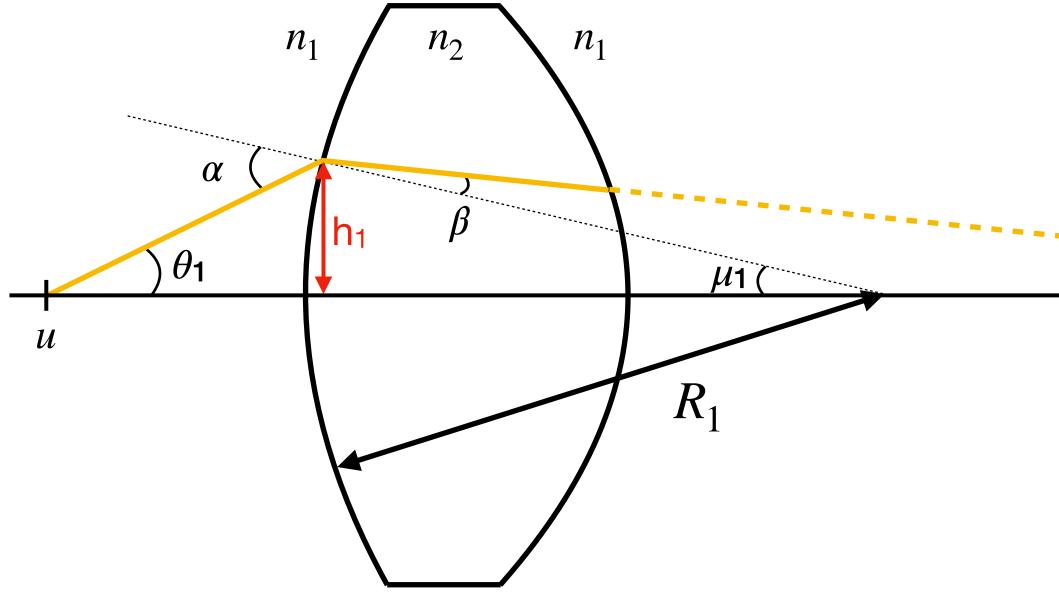


## **Geometrical Modeling of Lens Behaviors**





### **Geometrical Modeling of Lens Behaviors**



$$n_1 \sin \alpha = n_2 \sin \beta$$
  

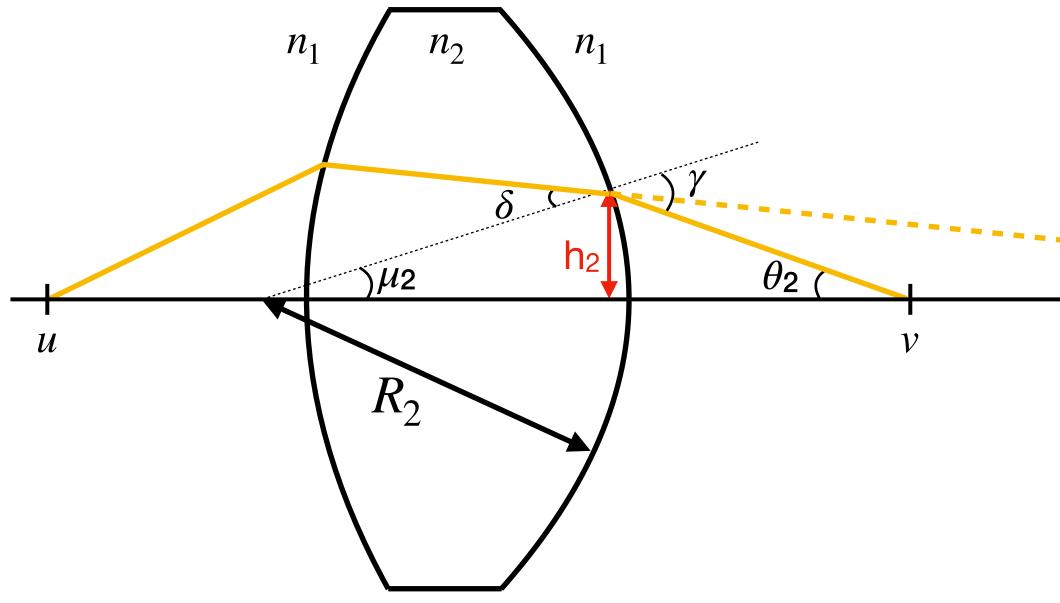
$$\alpha = \theta_1 + \mu_1 \quad \beta = \mu_1 - \phi$$
  

$$\sin \mu_1 = \frac{h_1}{R_1} \quad \tan \theta_1 = \frac{h_1}{u}$$

$$\phi$$
 (



### **Geometrical Modeling of Lens Behaviors**



$$n_{1} \sin \alpha = n_{2} \sin \beta$$

$$\alpha = \theta_{1} + \mu_{1} \quad \beta = \mu_{1} - \phi$$

$$\sin \mu_{1} = \frac{h_{1}}{R_{1}} \quad \tan \theta_{1} = \frac{h_{1}}{u}$$

$$\phi$$
 (

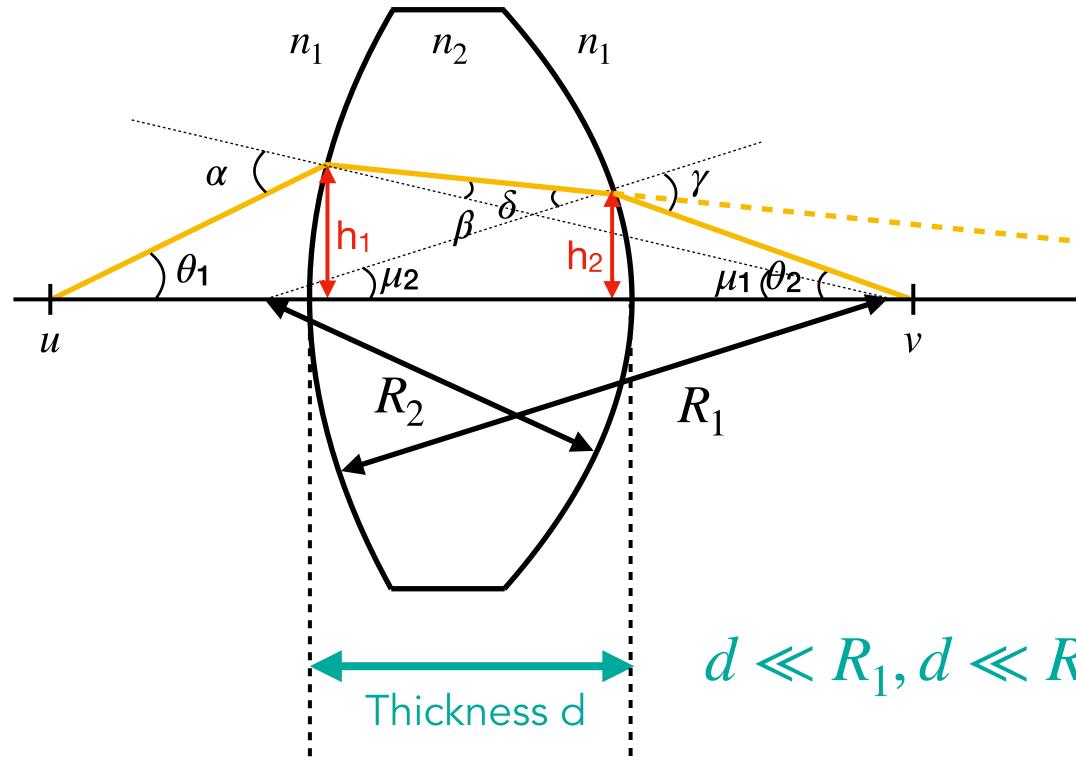
$$n_{2} \sin \delta = n_{1} \sin \gamma$$
  

$$\delta = \mu_{2} + \phi \quad \gamma = \mu_{2} + \theta_{2}$$
  

$$\sin \mu_{2} = \frac{h_{2}}{R_{2}} \quad \tan \theta_{2} = \frac{h_{2}}{v}$$



### **Assumption 1: Thin Lens Assumption**



$$n_{1} \sin \alpha = n_{2} \sin \beta$$

$$\alpha = \theta_{1} + \mu_{1} \quad \beta = \mu_{1} - \phi$$

$$\sin \mu_{1} = \frac{h_{1}}{R_{1}} \quad \tan \theta_{1} = \frac{h_{1}}{u}$$

$$\phi$$
 (

$$R_1 \Rightarrow h_1 \approx h_2$$

$$n_2 \sin \delta = n_1 \sin \gamma$$
  

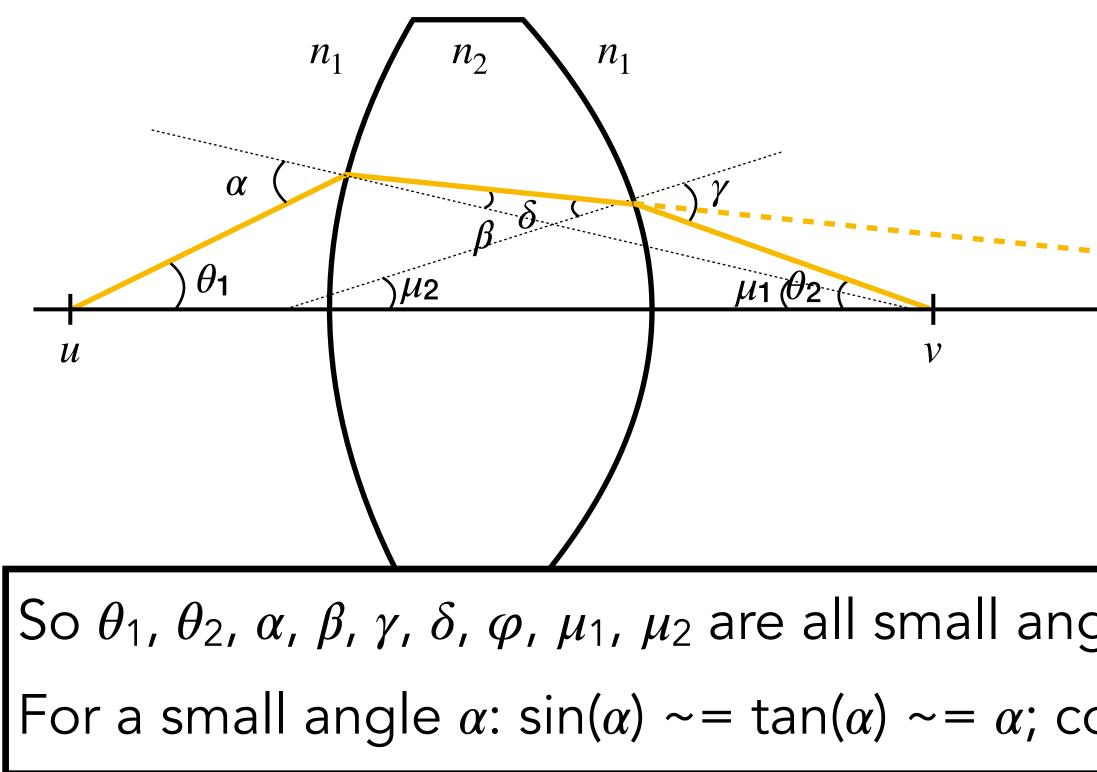
$$\delta = \mu_2 + \phi \quad \gamma = \mu_2 + \theta_2$$
  

$$\sin \mu_2 = \frac{h_2}{R_2} \quad \tan \theta_2 = \frac{h_2}{v}$$



# **Assumption 2: Paraxial Assumption**

Consider only rays staying close to the optical axis.



$$n_{1} \sin \alpha = n_{2} \sin \beta$$

$$\alpha = \theta_{1} + \mu_{1} \quad \beta = \mu_{1} - \phi$$

$$\sin \mu_{1} = \frac{h_{1}}{R_{1}} \quad \tan \theta_{1} = \frac{h_{1}}{u}$$

gles.  
os(
$$\alpha$$
) ~= 1.

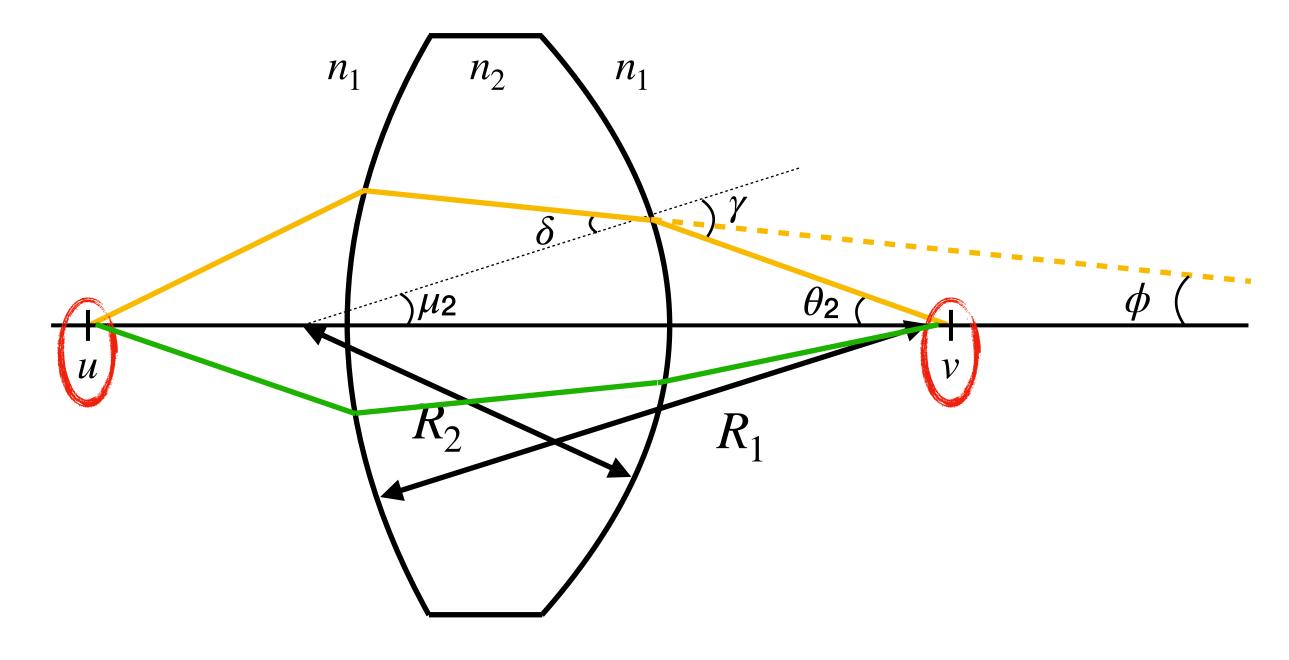
$$n_2 \sin \delta = n_1 \sin \gamma$$
  

$$\delta = \mu_2 + \phi \quad \gamma = \mu_2 + \theta_2$$
  

$$\sin \mu_2 = \frac{h_2}{R_2} \quad \tan \theta_2 = \frac{h_2}{v}$$



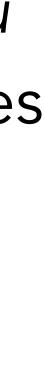
### Lens Marker's Equation



$$\frac{n_2 - n_1}{n_1} \left(\frac{1}{R_1} + \frac{1}{R_2}\right) = \left(\frac{1}{u} + \frac{1}{v}\right)$$

Observe that v depends only on u regardless of the path the ray takes (for a given camera)

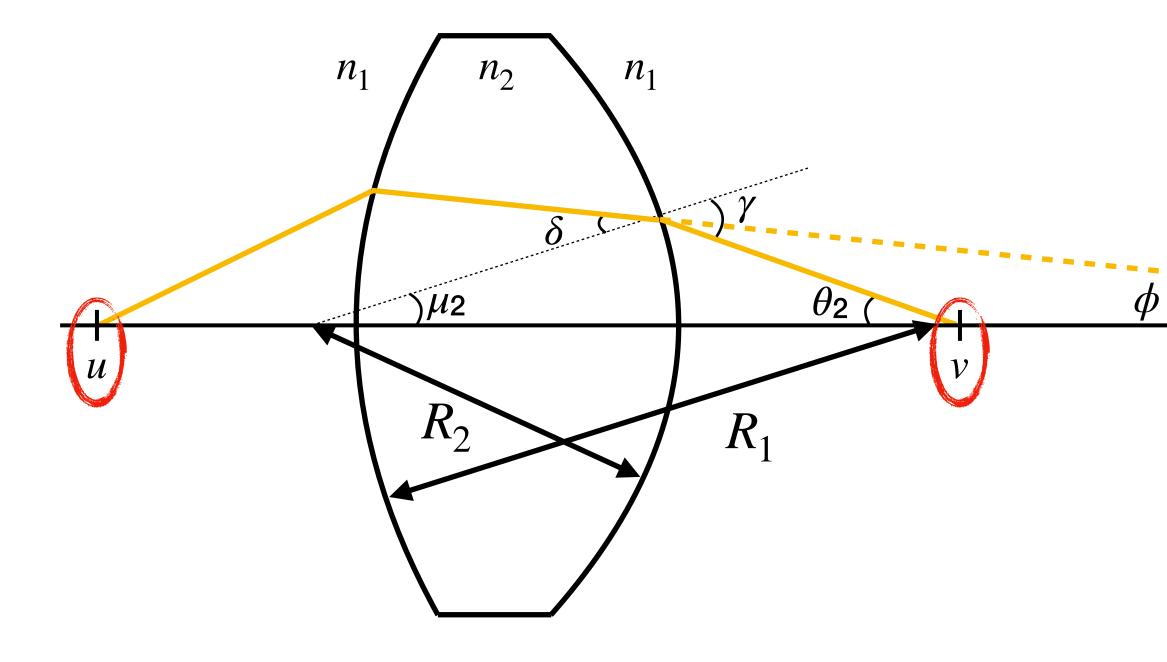
- So all rays from an on-axis point focus at the same point
- In reality, only paraxial rays follow this (more later)







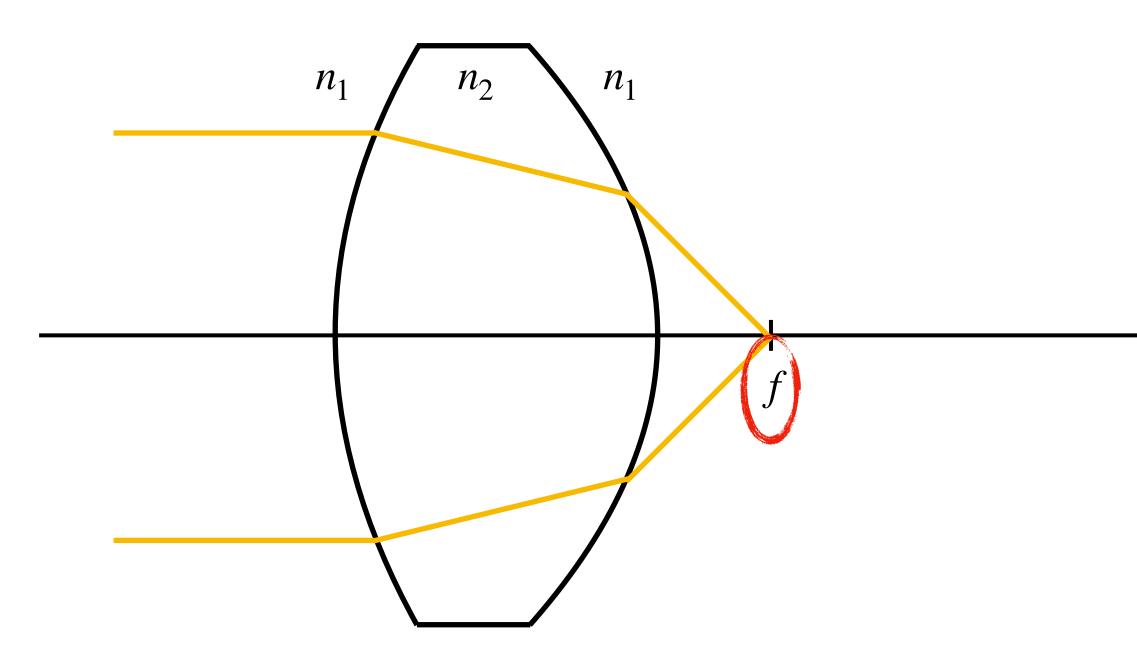
#### Lens Marker's Equation



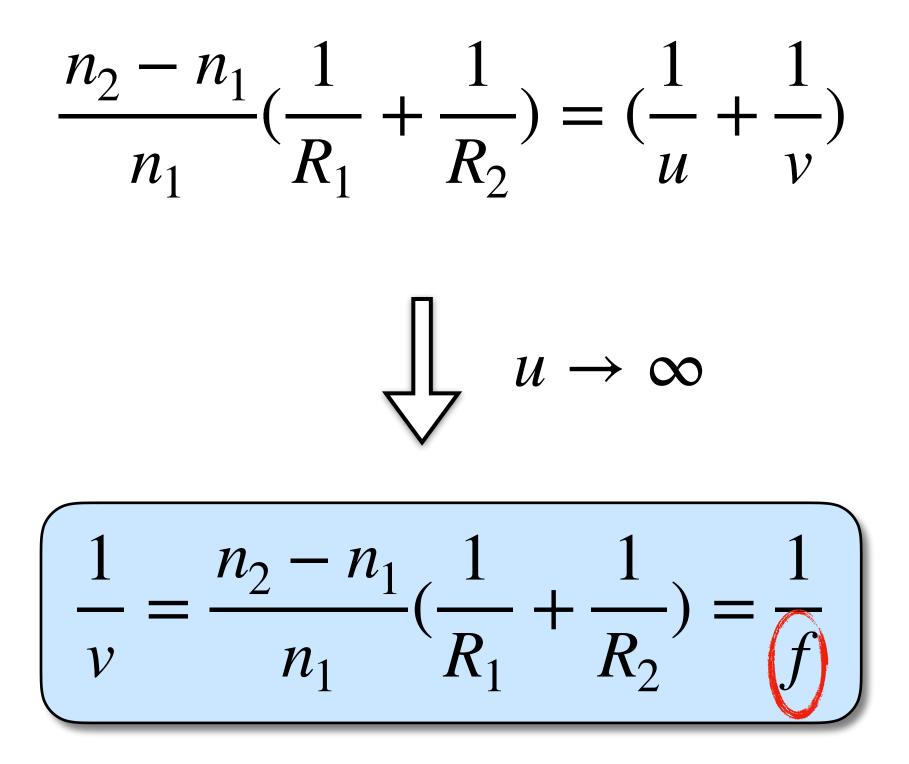
$$\frac{n_2 - n_1}{n_1} \left(\frac{1}{R_1} + \frac{1}{R_2}\right) = \left(\frac{1}{u} + \frac{1}{v}\right)$$
$$\int u \to \infty$$



#### Gauss' Lens Equation



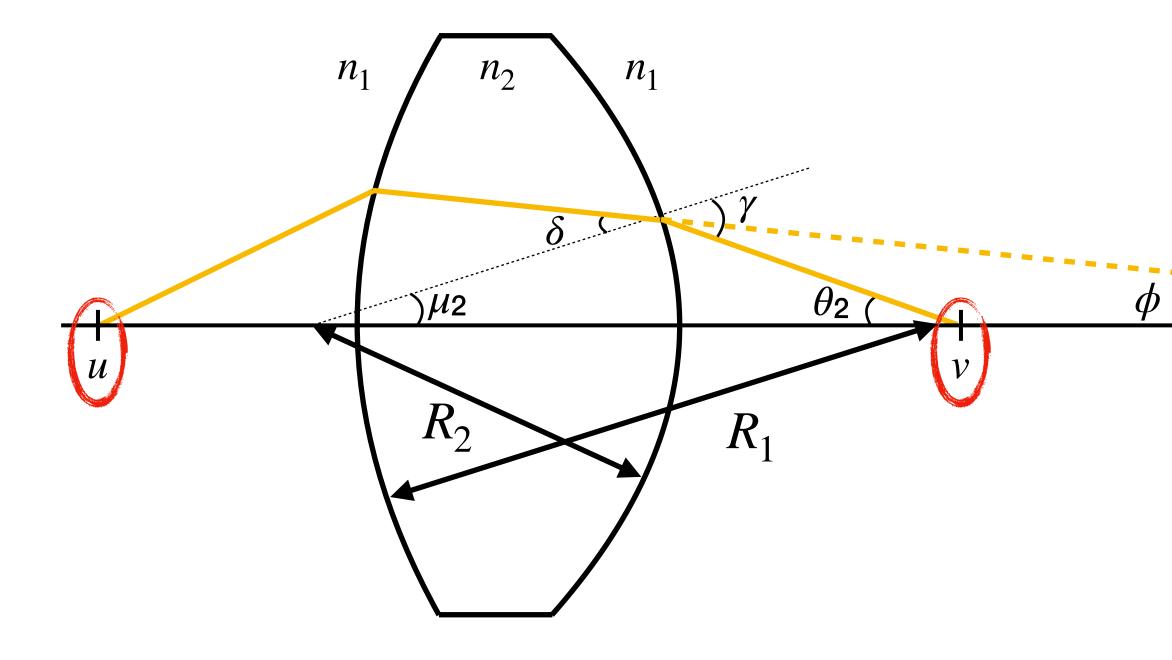
That is, incident rays parallel to optical axis converge at the same point

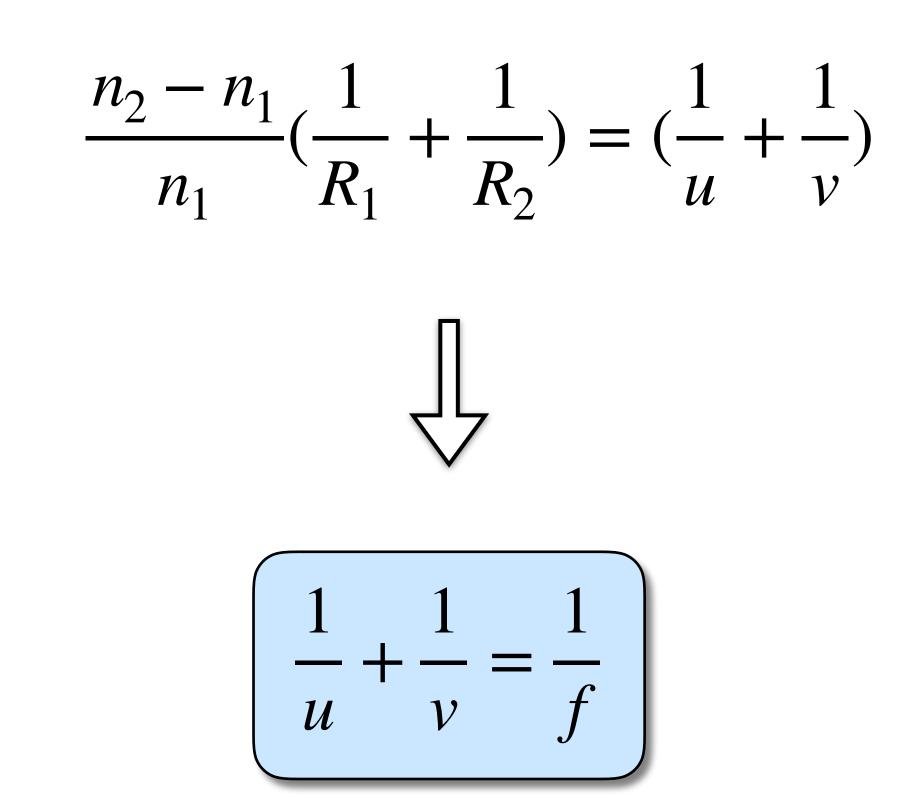


Where parallel rays converge is **defined** as the focal point



#### **Gauss' Lens Equation**



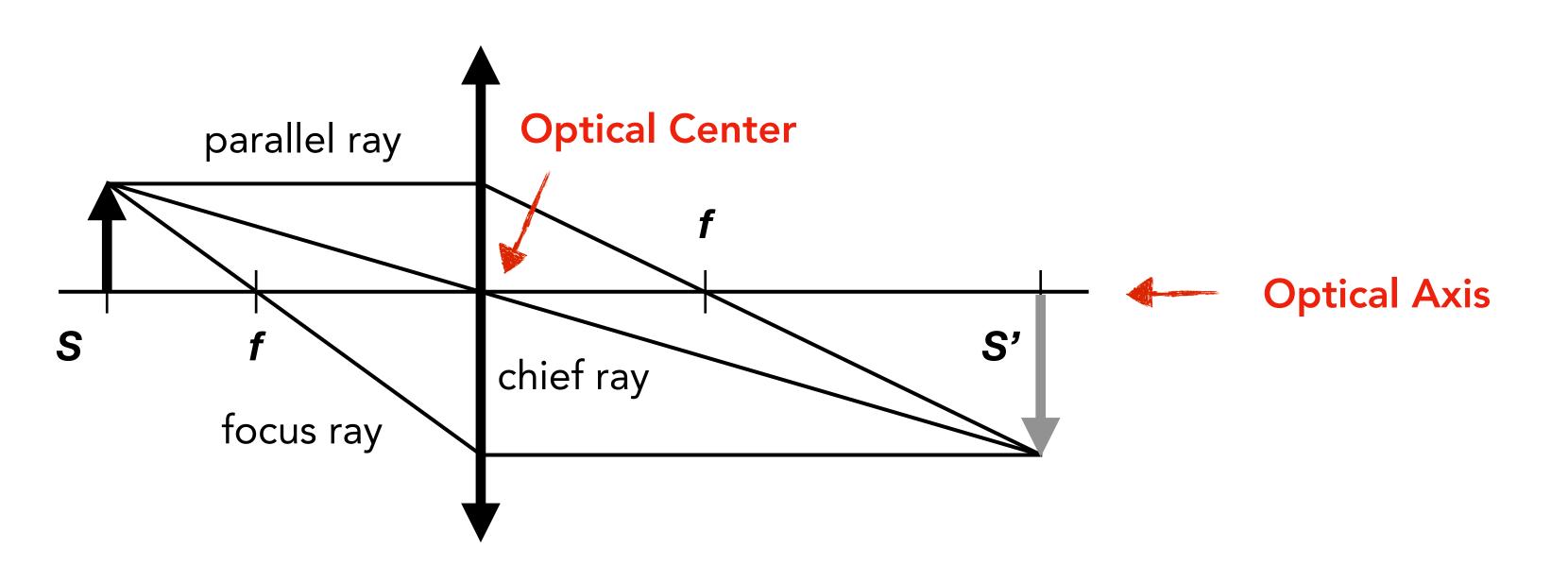




## Simple "Rules" for Ideal Lens

Under thin lens and paraxial ray approximations:

- Rays passing through the focal point will be parallel on the other side.



• Rays parallel to the optical axis always pass through the focal point on the other side.

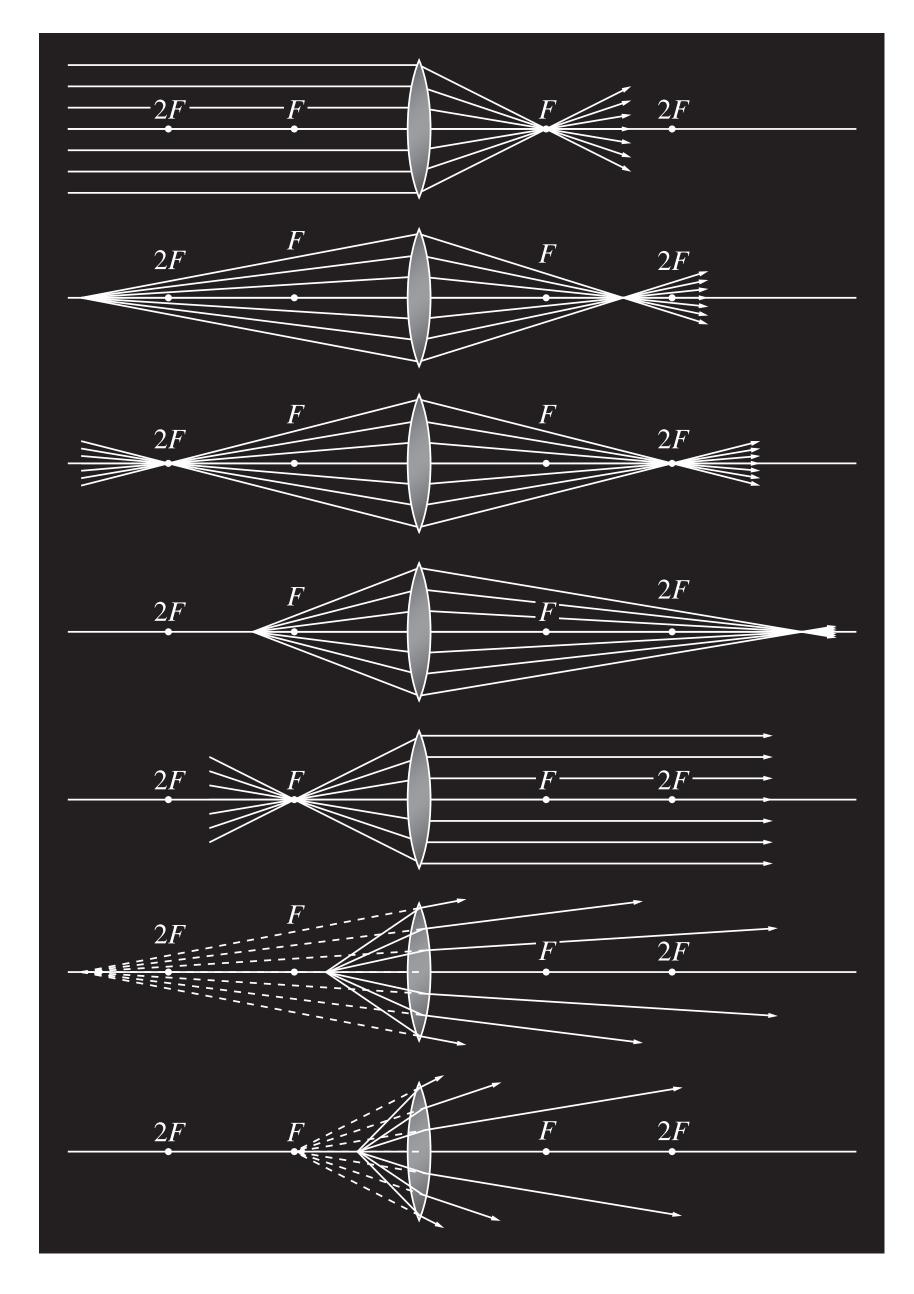
• Rays passing through the optical center won't change direction if the lens is symmetric.



### Ideal Lens

Move the sensor plane to focus on scene points at different distances.

- This is how camera auto-focus works (later)
- Or equivalently move the lens



Optics, Hecht, 5ed





### Ideal Lens

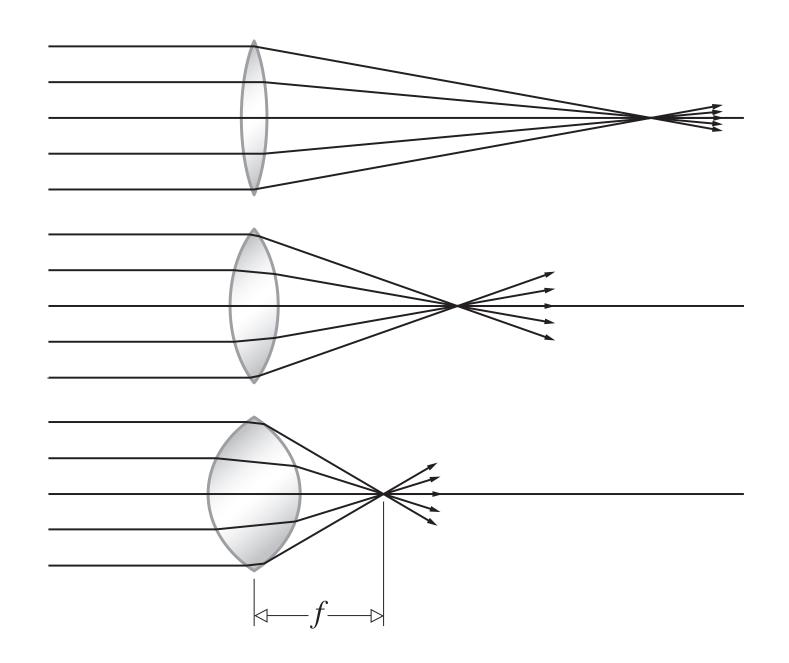
Move the sensor plane to focus on scene points at different distances.

- This is how camera auto-focus works (later)
- Or equivalently move the lens

The greater the curvature, the shorter the focal length and the more "optical power".

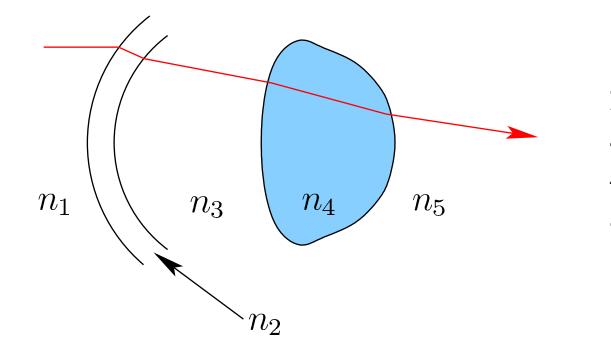
• Need higher optical power to focus on closer objects.





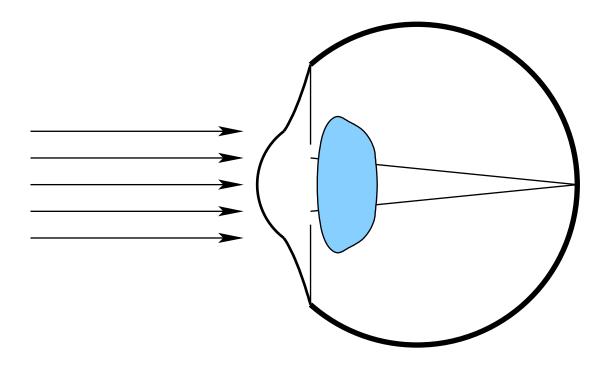


#### **Optics in Human Eyes**

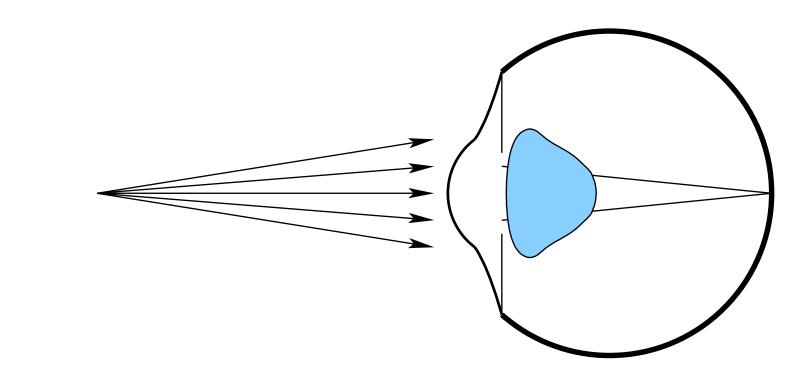


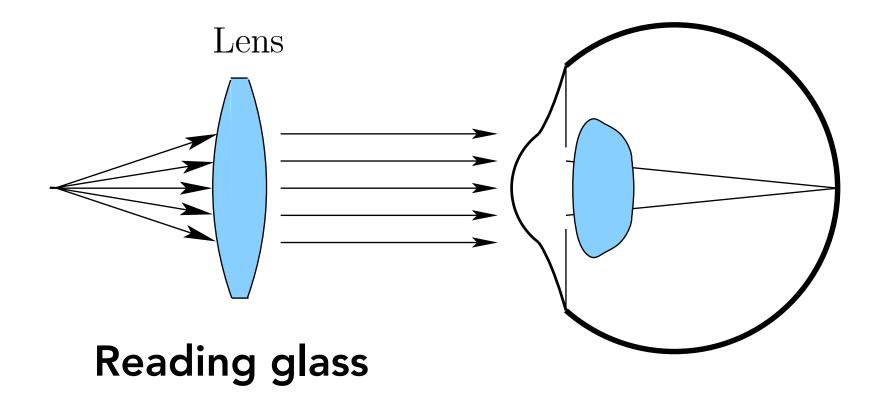
1.  $n_1 = 1.009$  (air) 2.  $n_2 = 1.376$  (cornea) 3.  $n_3 = 1.336$  (aqueous fluid) 4.  $n_4 = 1.413$  (lens) 5.  $n_5 = 1.337$  (vitreous fluid)

Figure 4.25: A ray of light travels through five media before hitting the retina. The indices of refraction are indicated. Considering Snell's law, the greatest bending occurs due to the transition from air to the cornea. Note that once the ray enters the eye, it passes through only liquid or solid materials.



Eye lenses "accommodate" to focus on objects of different distances

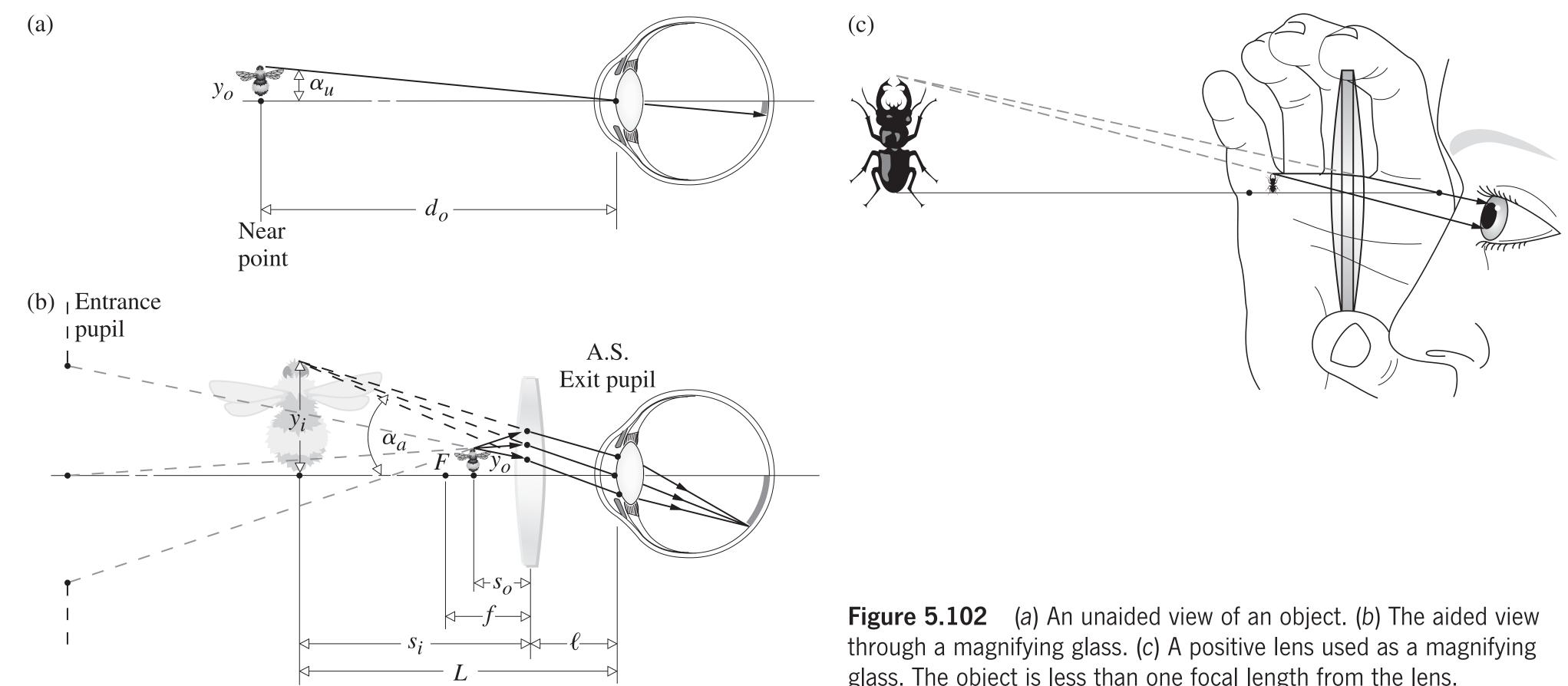








### When Object is Closer Than f



glass. The object is less than one focal length from the lens.

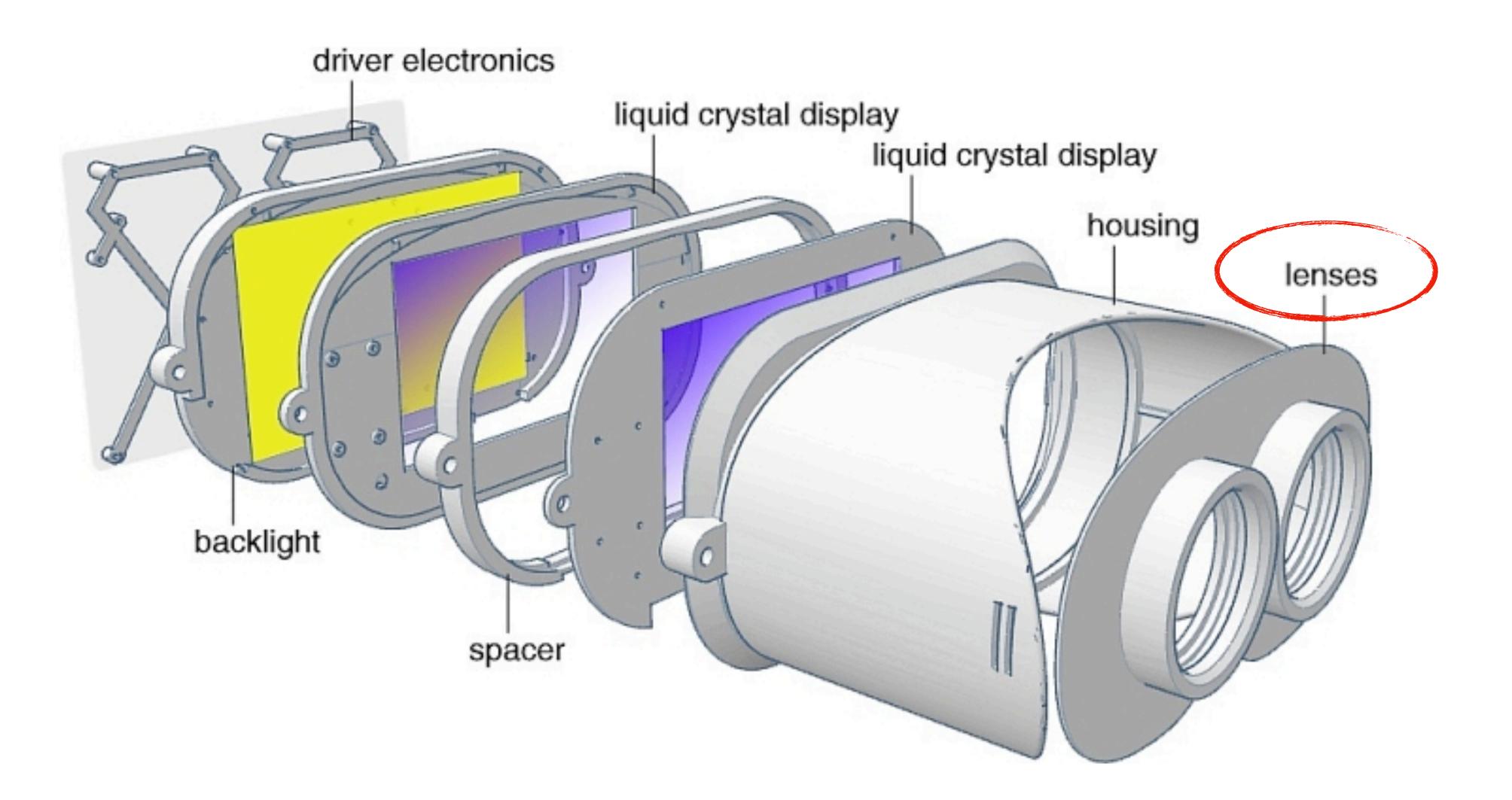




https://activeforlife.com/play-centres/ 42



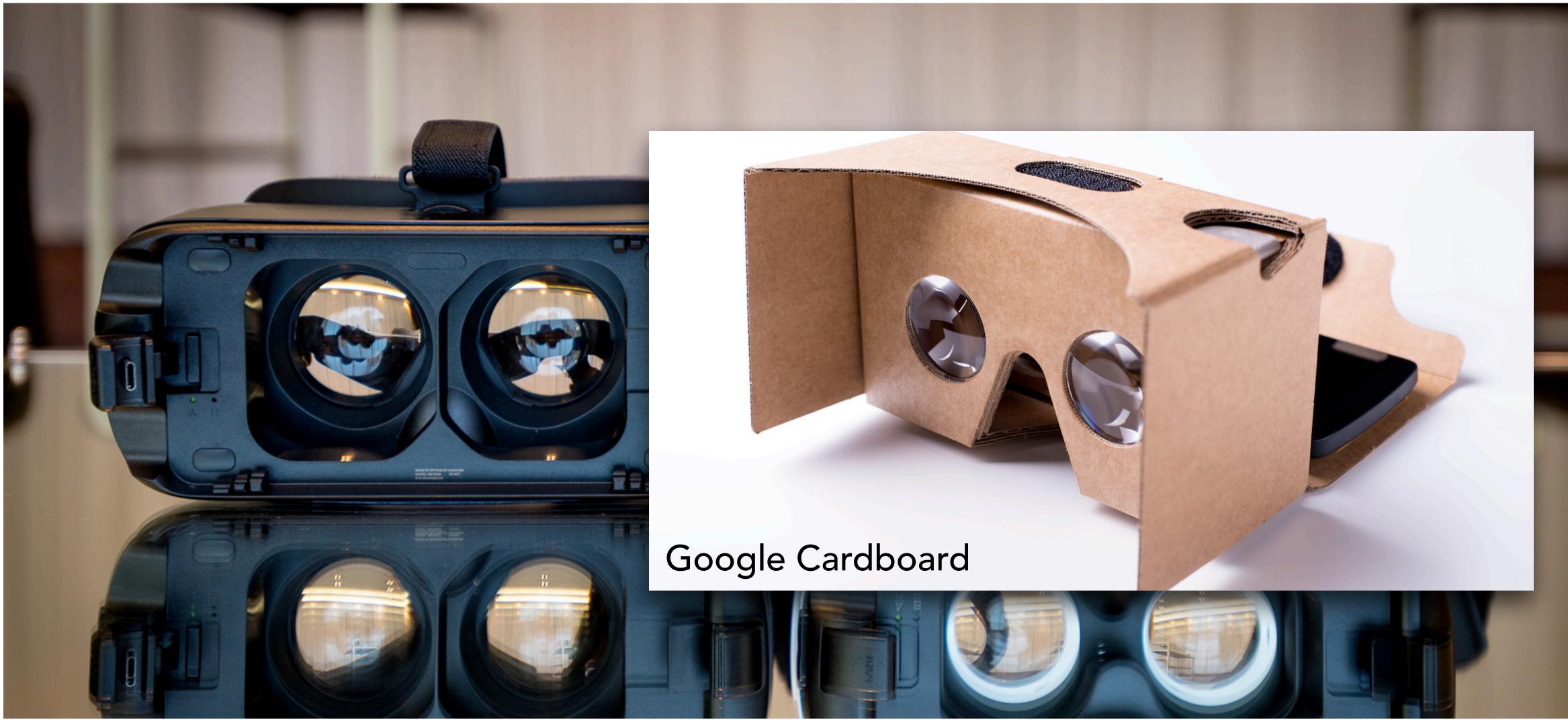
## Virtual Reality Display







#### Lenses in Virtual Reality Display

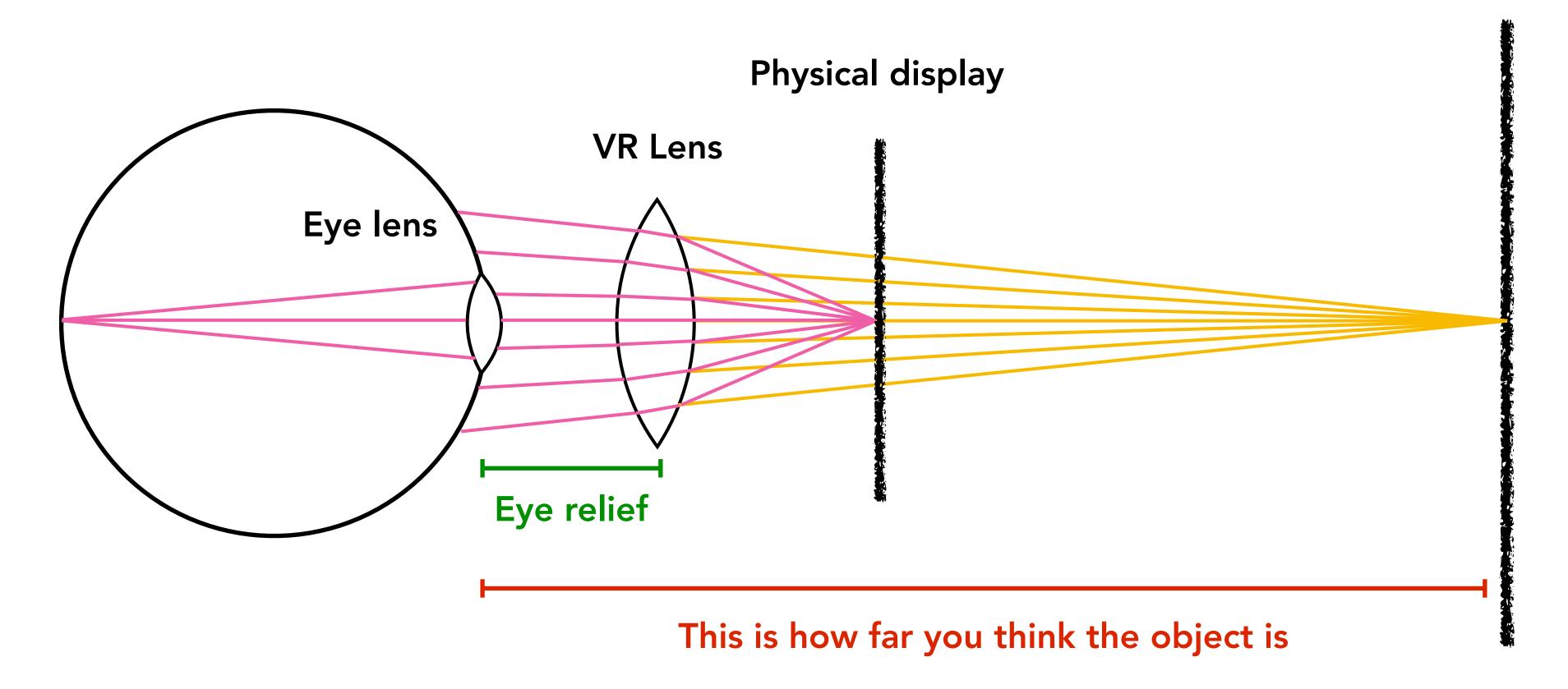


https://www.tomshardware.com/news/virtual-reality-lens-basics-vr,36182.html 44 https://www.youtube.com/watch?v=4VdQr4T5wN8





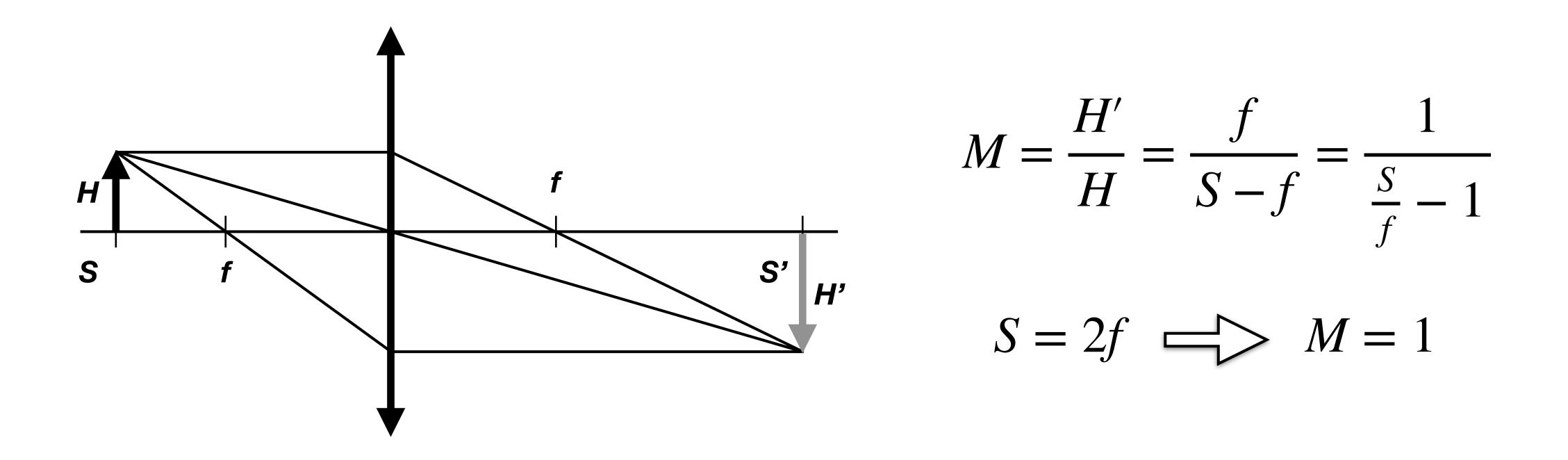
## Lens in Virtual Reality Display







#### Magnification





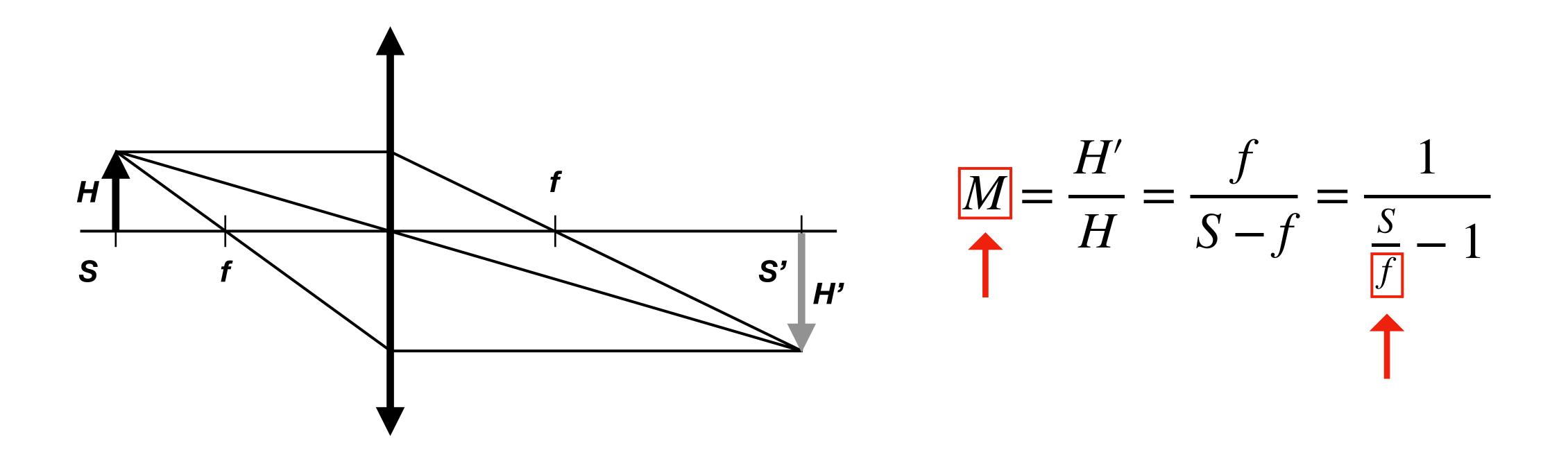






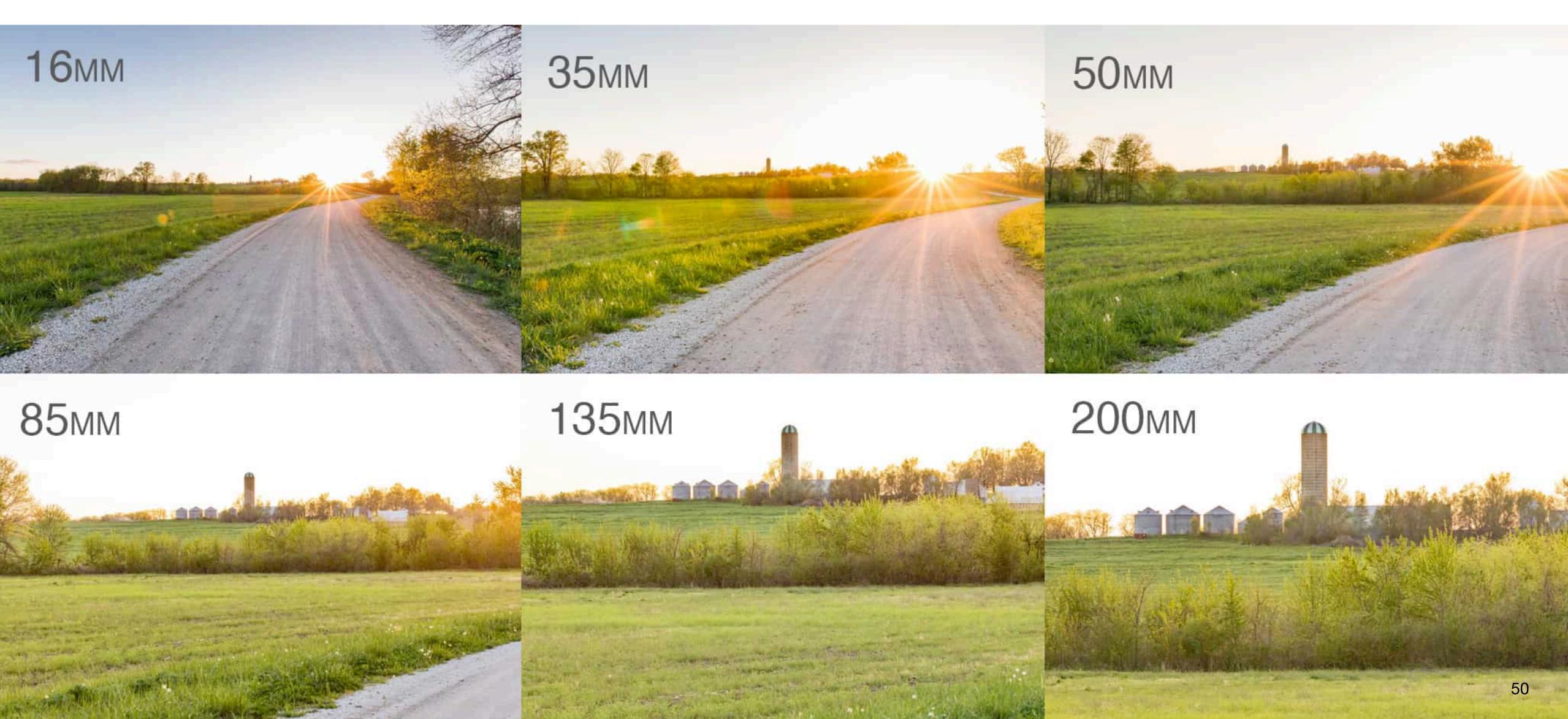


#### Magnification



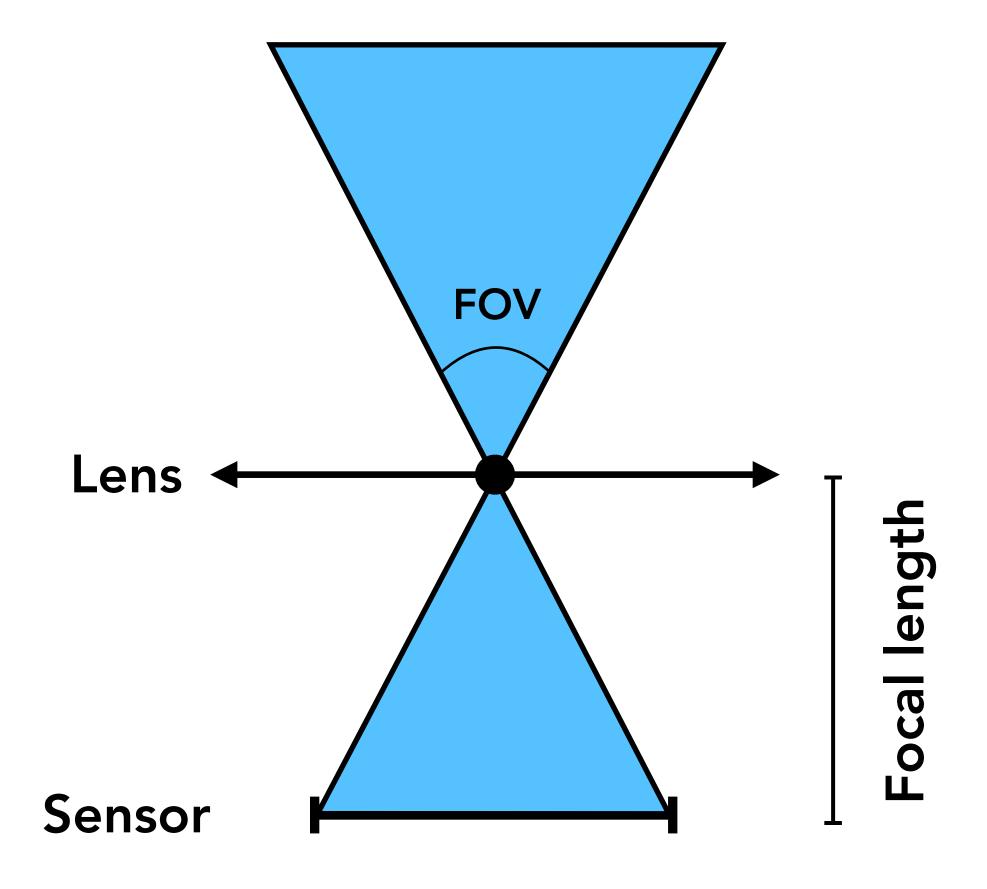


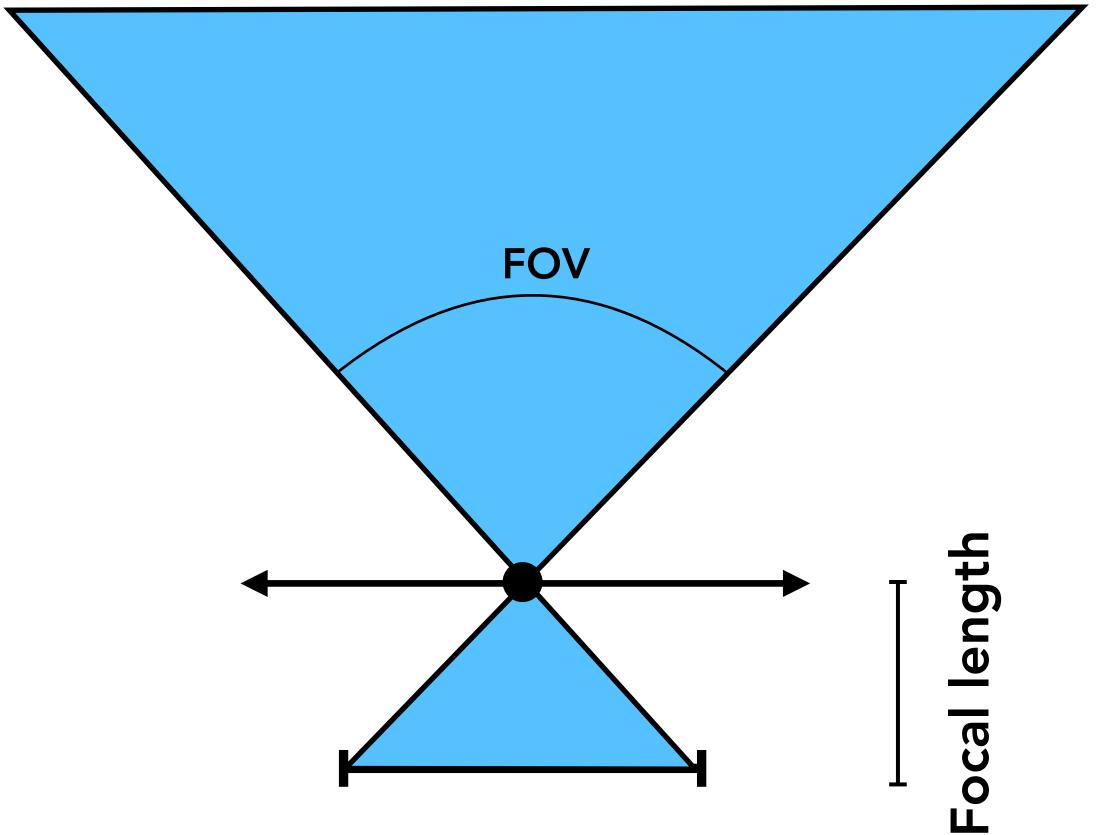
#### **Increasing Focal Length**





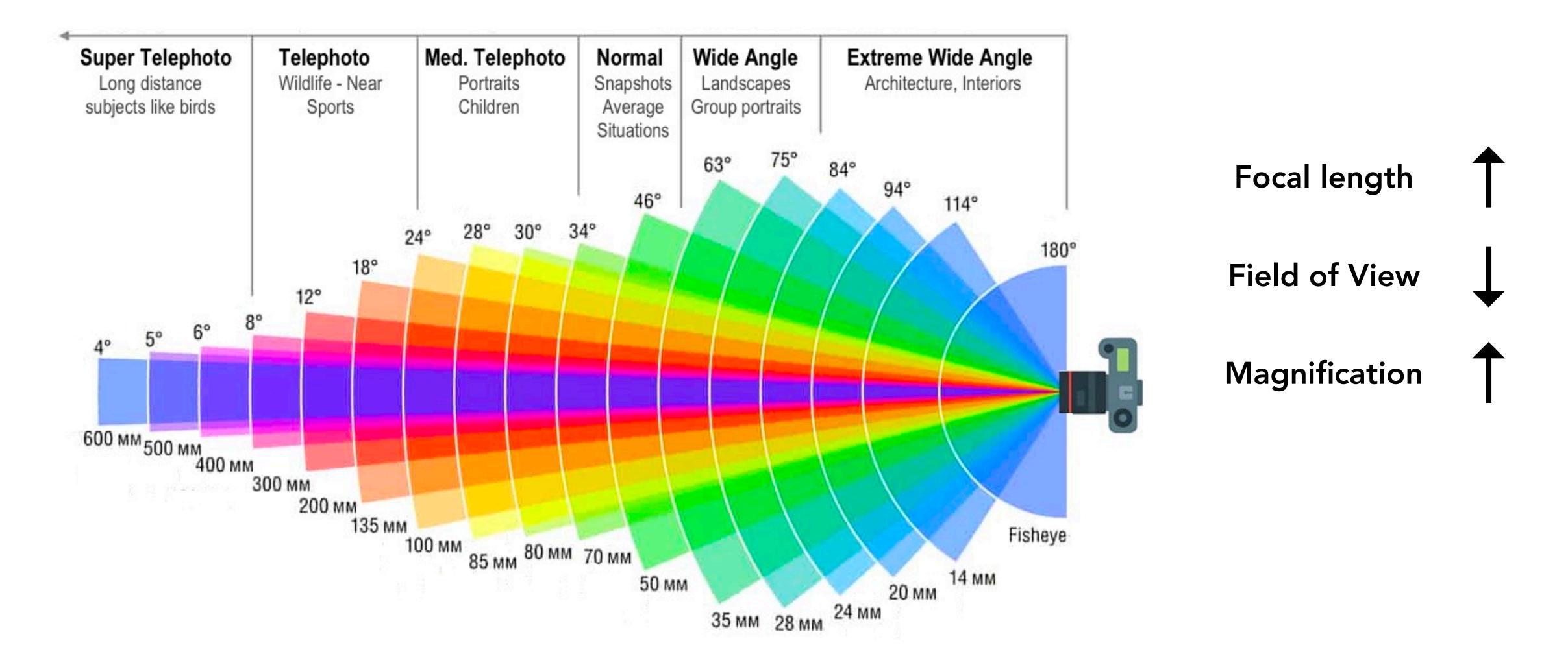
#### **Increasing Focal Length Reduces Field of View**







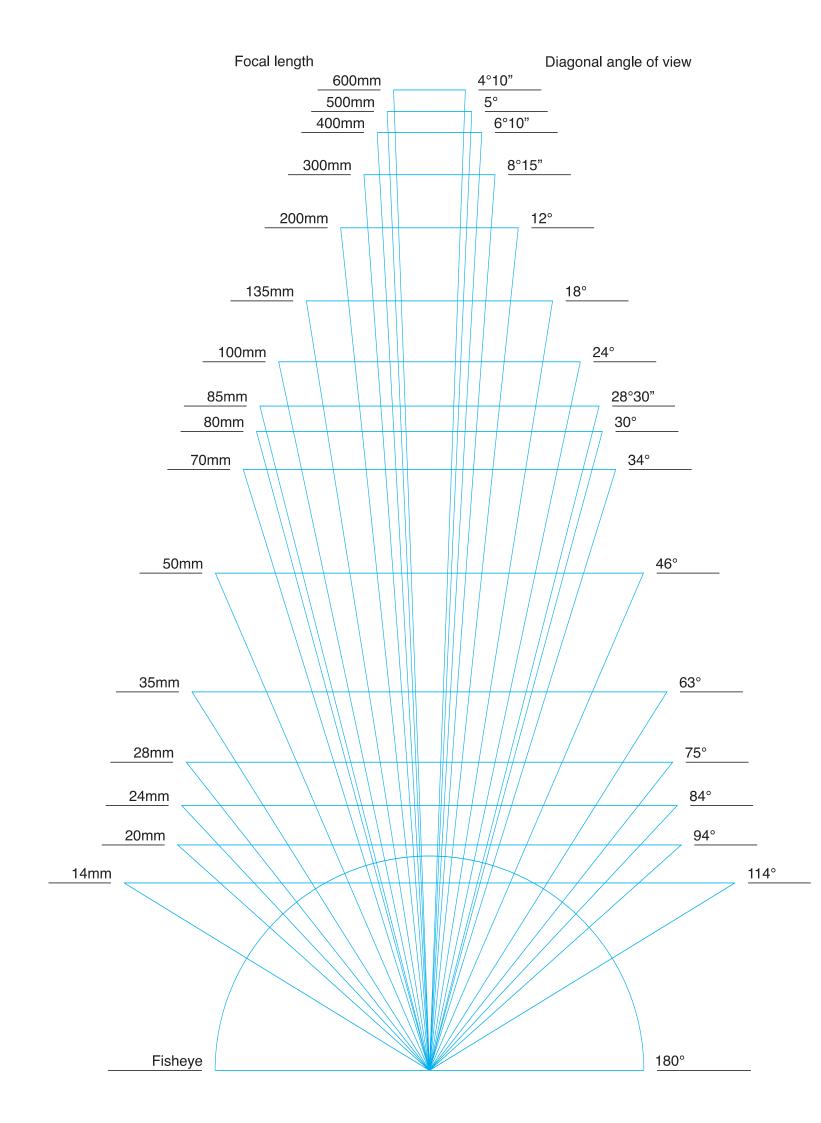
## Focal Length vs. Field of View vs. Magnification



https://infocusfilmschool.com/how-to-use-lenses-in-film/focal-length-and-angle-of-view-guide/



## Focal Length vs. Field of View



15mm (fisheye)









14mm 🦳



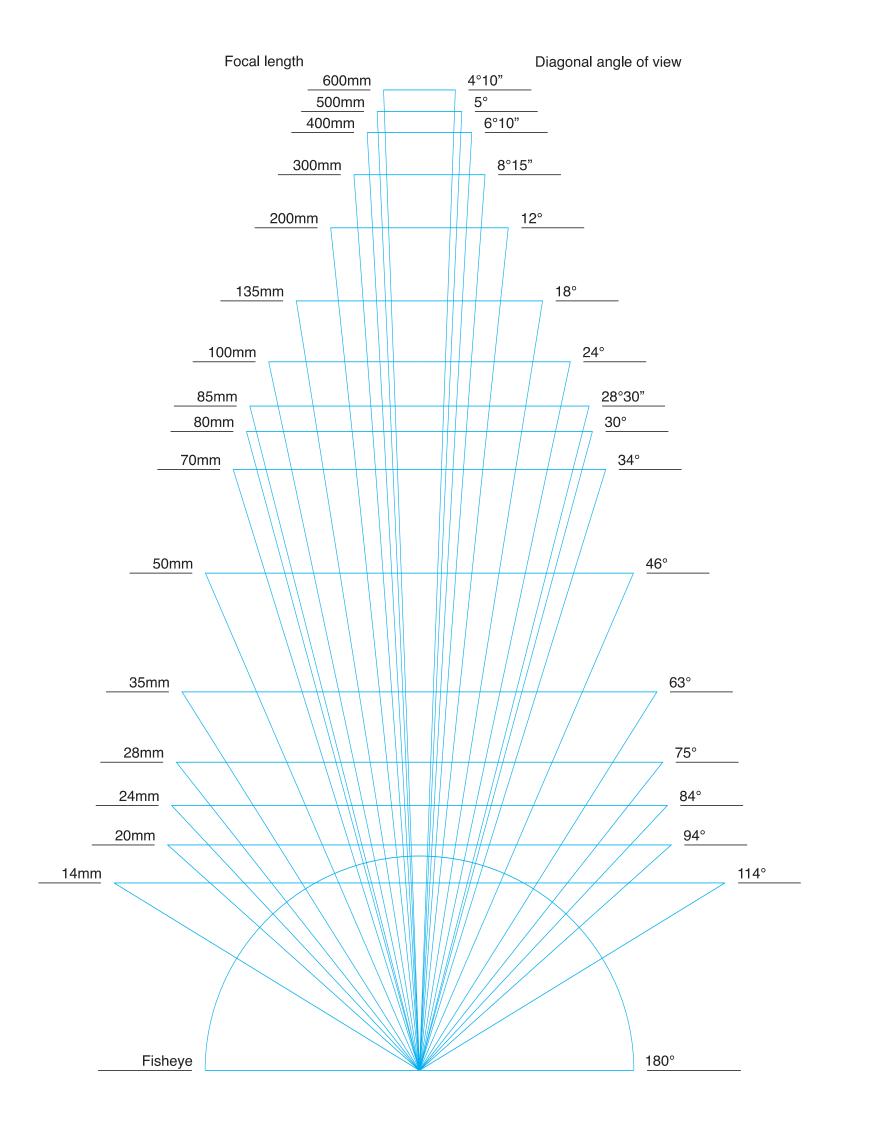


Canon - EF Lens Work III-The Eye of EOS, 8e 53





## Focal Length vs. Field of View



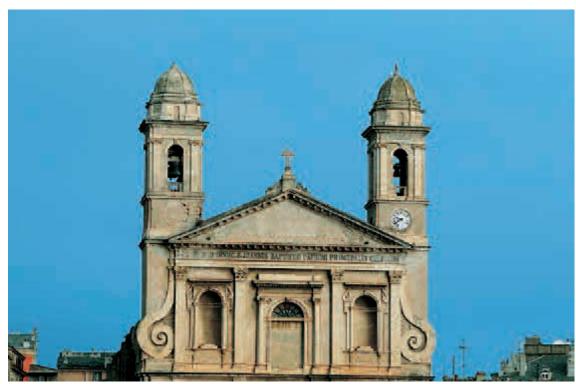




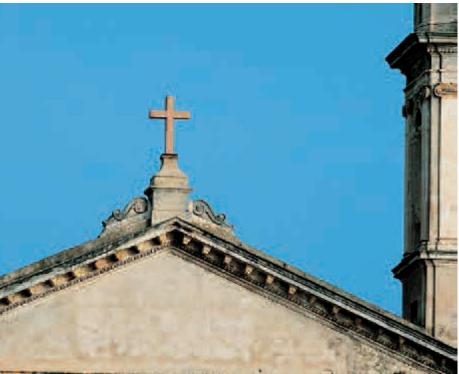




135mm









Canon - EF Lens Work III-The Eye of EOS, 8e 54





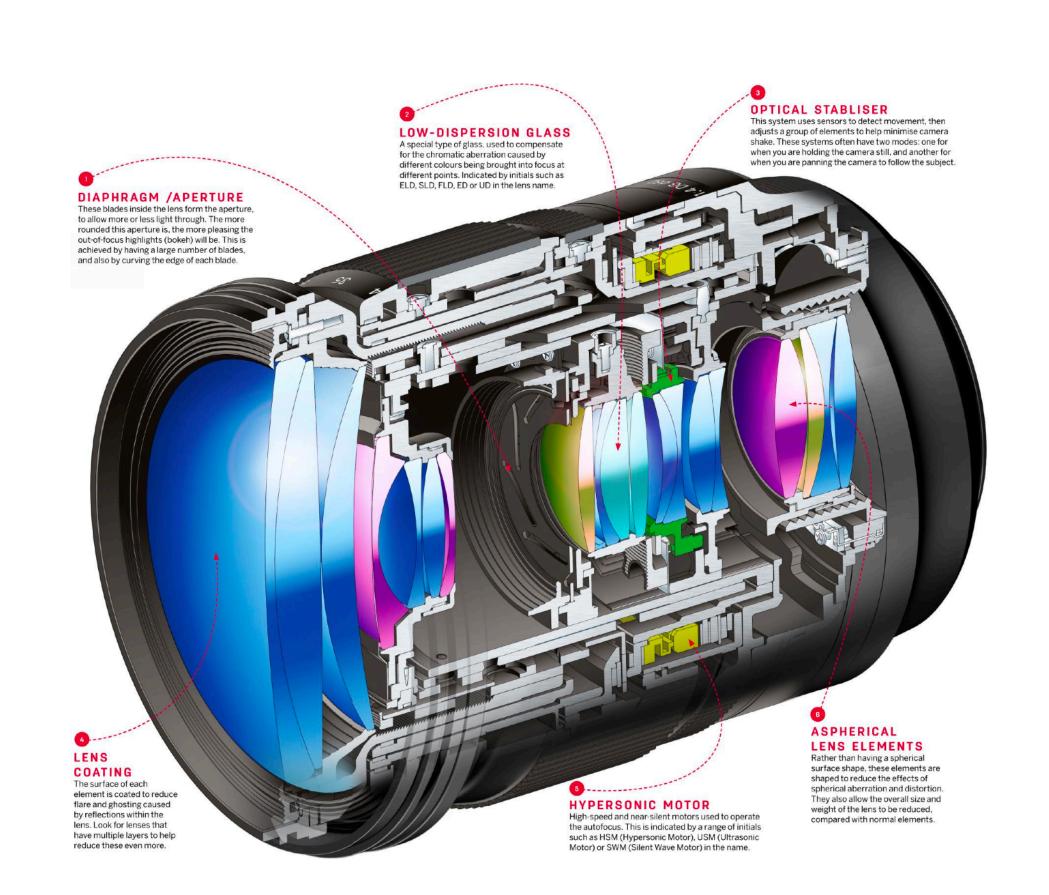
#### **Telephoto Cameras**

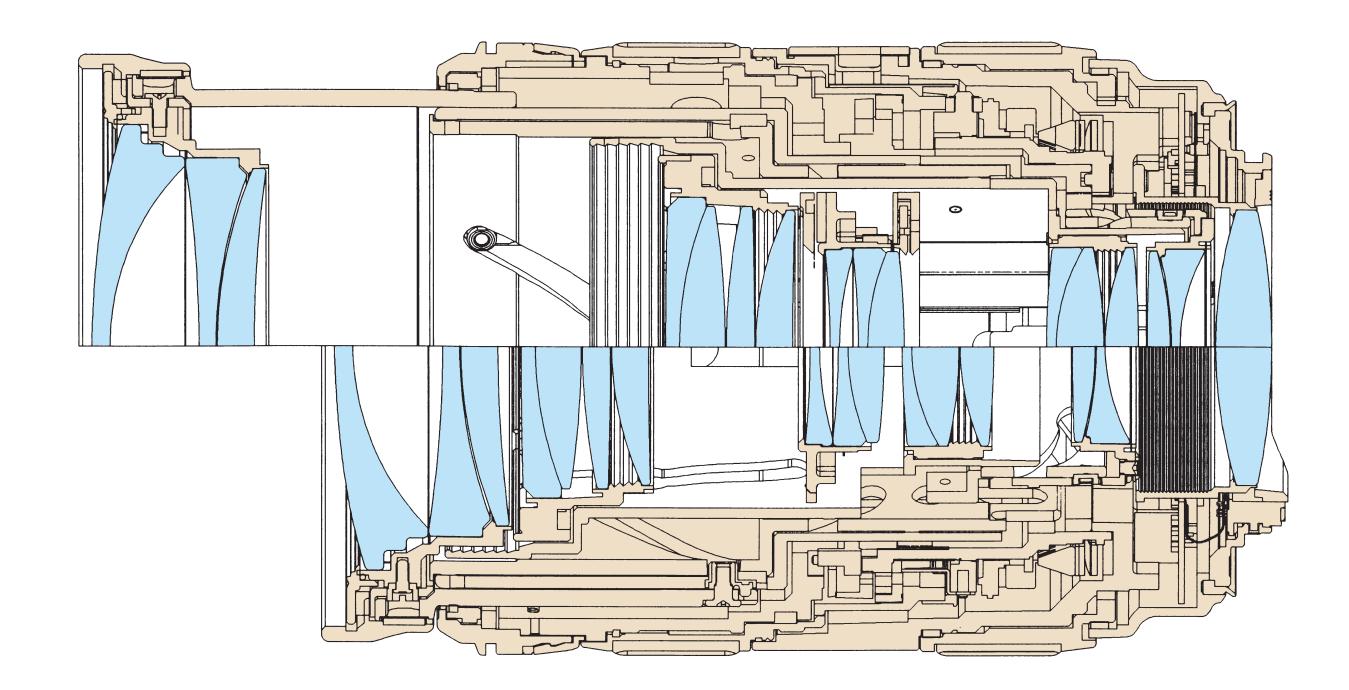


Real Lenses



## **Real Lenses are Very Complex**



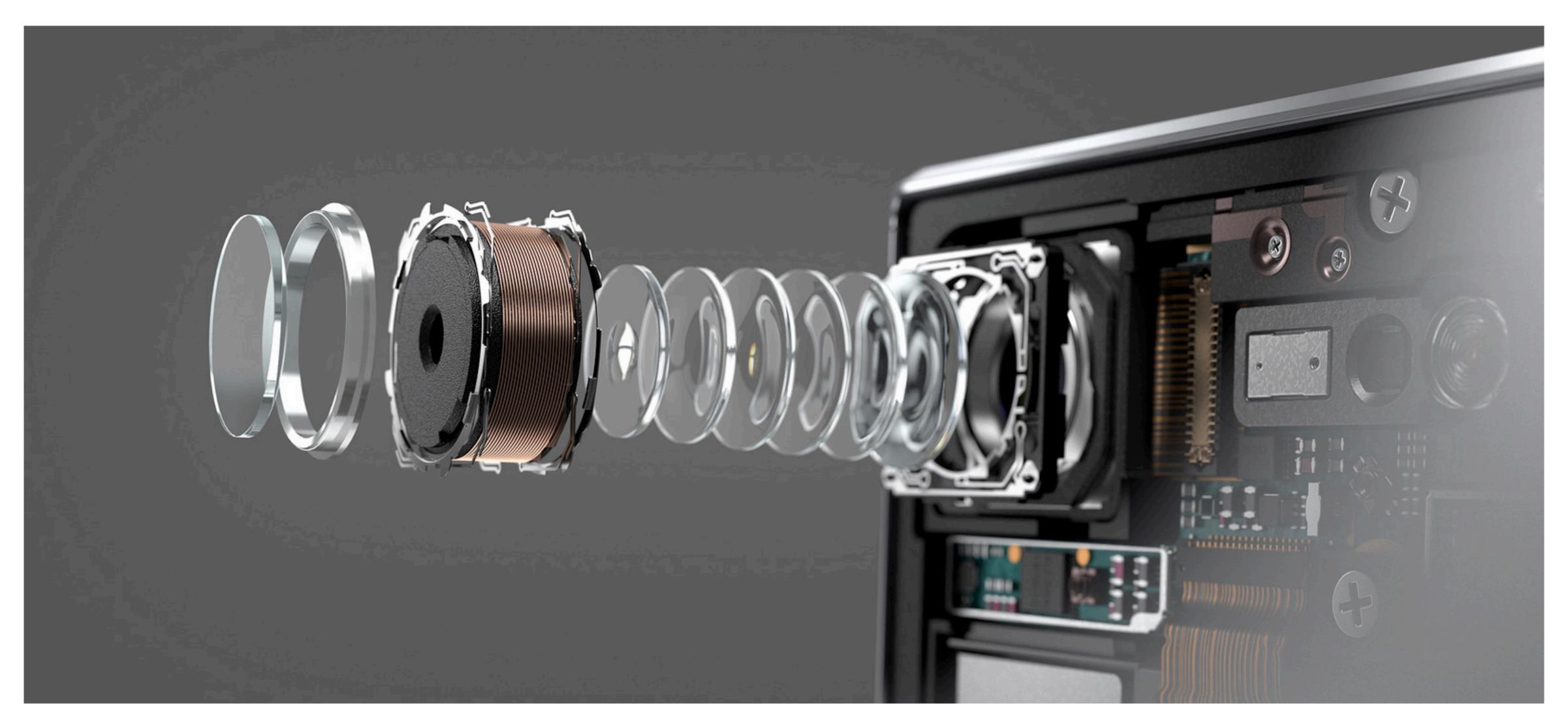


#### Cross section of the EF 24-70 mm f/2.8

Canon - EF Lens Work III-The Eye of EOS, 8e https://www.scribd.com/article/372092140/Anatomy-Of-Alens 57



### Real Lenses are Very Complex



https://wccftech.com/samsung-developed-5x-periscope-zoom-camera-module/ 58



#### **Real Lenses**

So far we've assumed thin lens and paraxial approximations.

Real lenses are neither thin nor can we ignore non-paraxial rays.

optics principles still apply.

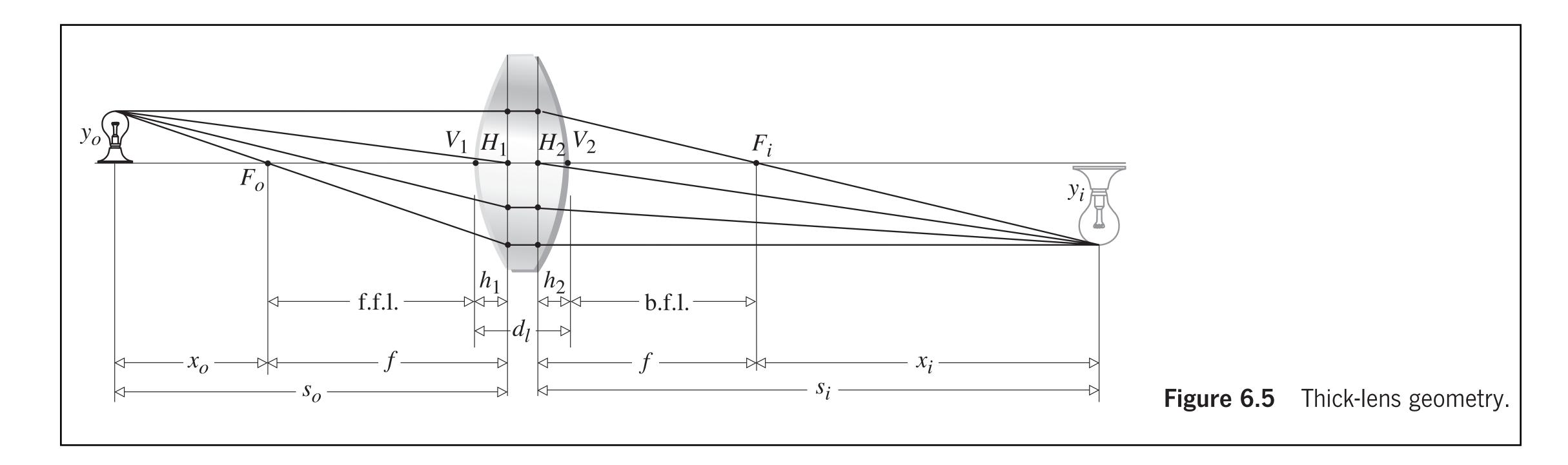
A typical strategy to correct deviations from ideal lenses is to cascade a sequence of lenses, i.e., compound lens.

- So real lens behaviors deviate away from ideal lens, but the same geometrical



## **Thick Lens Geometry**

Simplifications made for thin lenses won't apply.



# The same geometric principles still apply; need to consider more parameters.

Optics, Hecht, 5ed



#### Lens Aberrations

Recall paraxial rays are rays that stay close to optical axis throughout the system. These rays:

- are originated from objects close to/on optical axis **AND**
- have a small incident angle when approaching the lens

(Monochromatic) aberrations refer to deviations from ideal lens when considering non-paraxial rays, i.e.,:

- Rays that are not originated from from objects close to/on optical axis **OR**
- Have oblique incident angles



#### Lens Aberrations

considering only the first term), five forms of aberrations show up:

- spherical aberration, coma, astigmatism, field curvature, distortion
- This is called third-order theory, c.f. paraxial approximation (which is called first-order theory or Gaussian Optics).

Higher-order aberrations show up when considering additional terms.

#### **Chromatic** aberrations:

• arise from the fact that refractive index is actually a function of frequency.

$$\sin \phi = \phi \left[ -\frac{\phi^3}{3!} + \frac{\phi^5}{5!} - \frac{\phi^7}{7!} + \cdots \right]$$

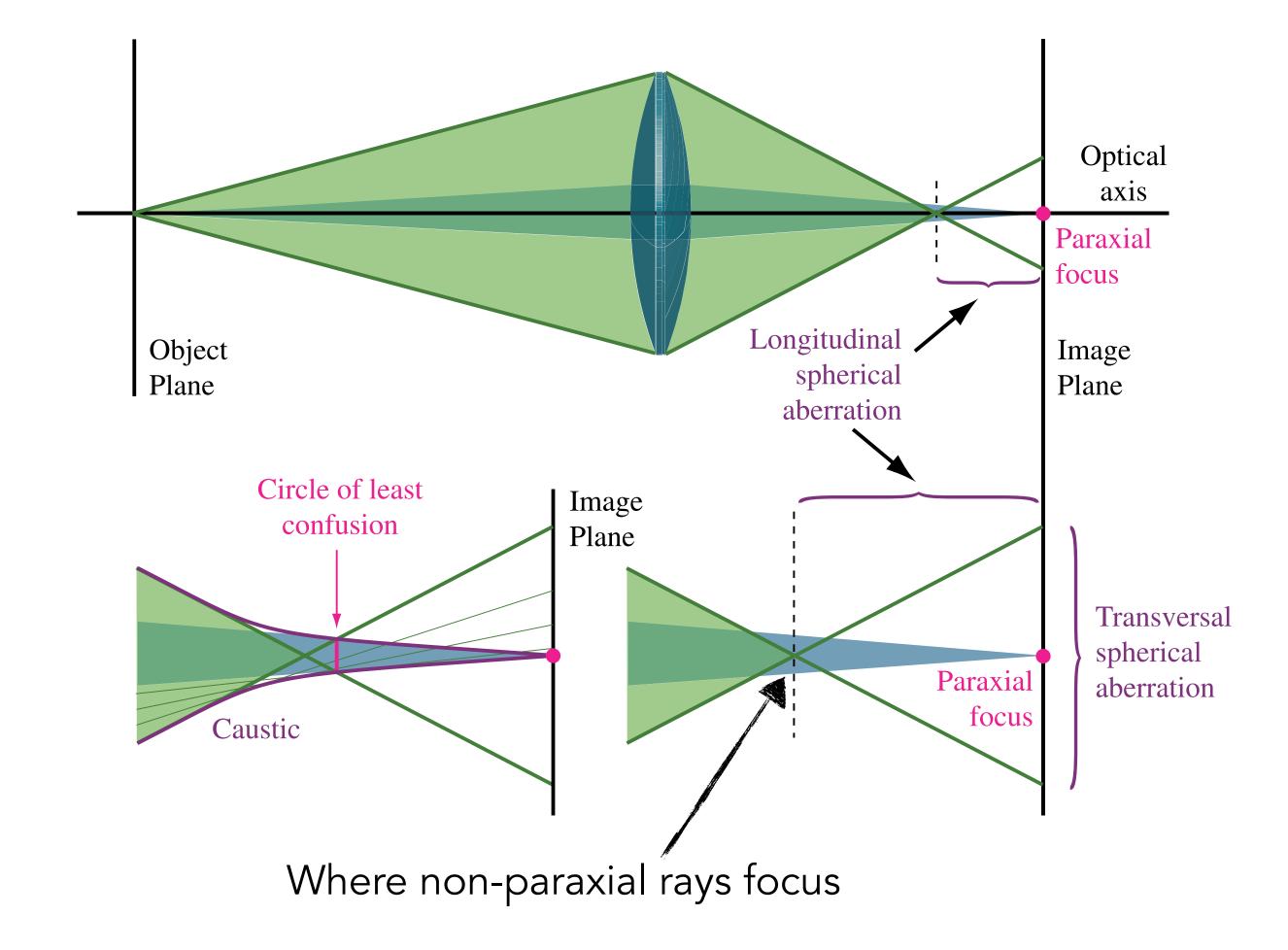
When considering the second term of Taylor series expansion (compared to



## **Spherical Aberration**

For a spherical lens:

- For a point on the optical axis, its nonparaxial rays will not focus at the same point.
- By extension, not all parallel rays (which includes non-paraxial parallel rays) focus at the same point.



Color Imaging-Fundamentals and Applications, Reinhard https://en.wikipedia.org/wiki/Spherical\_aberration





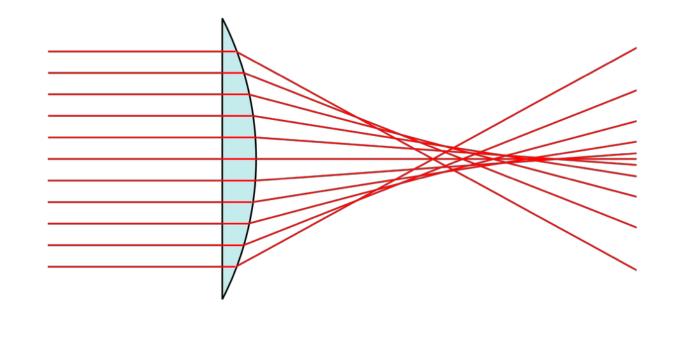
## **Spherical Aberration**

For a spherical lens:

- For a point on the optical axis, its nonparaxial rays will not focus at the same point.
- By extension, not all parallel rays (which includes non-paraxial parallel rays) focus at the same point.

Fixing spherical aberrations:

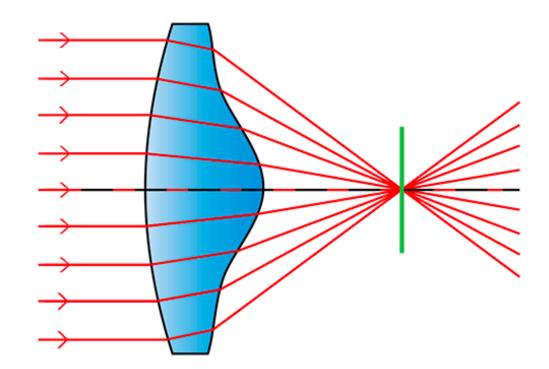
- Using a combination of convex and concave lens
- Using aspherical/hyperbolic lens



#### Hyperbolic lens

**Spherical lens** 

#### **Aspherical lens**

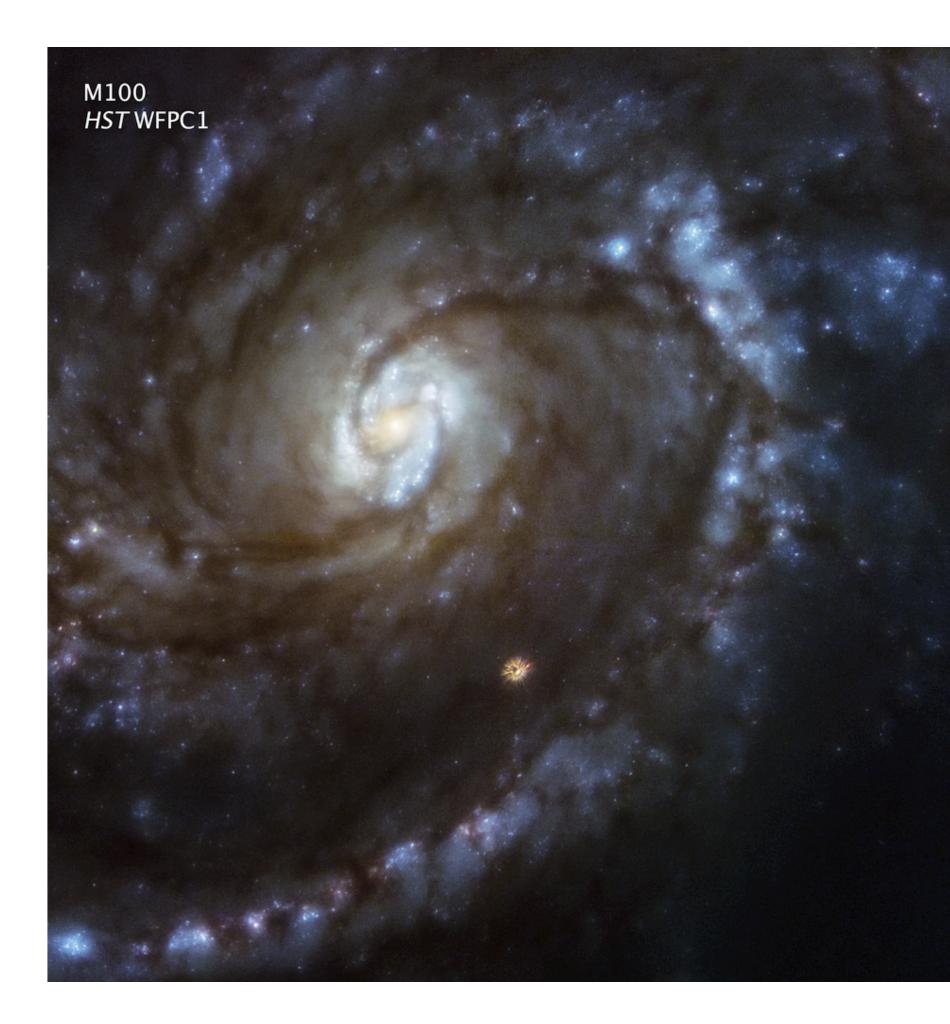


https://photographylife.com/what-is-spherical-aberration https://en.wikipedia.org/wiki/Spherical\_aberration





#### **Spherical Aberration**



#### Hubble Space Telescope images of the M-100 galaxy with (before repair) and without (after repair) spherical aberration.



https://hubblesite.org/image/4272/news/37-spiral-galaxies 65

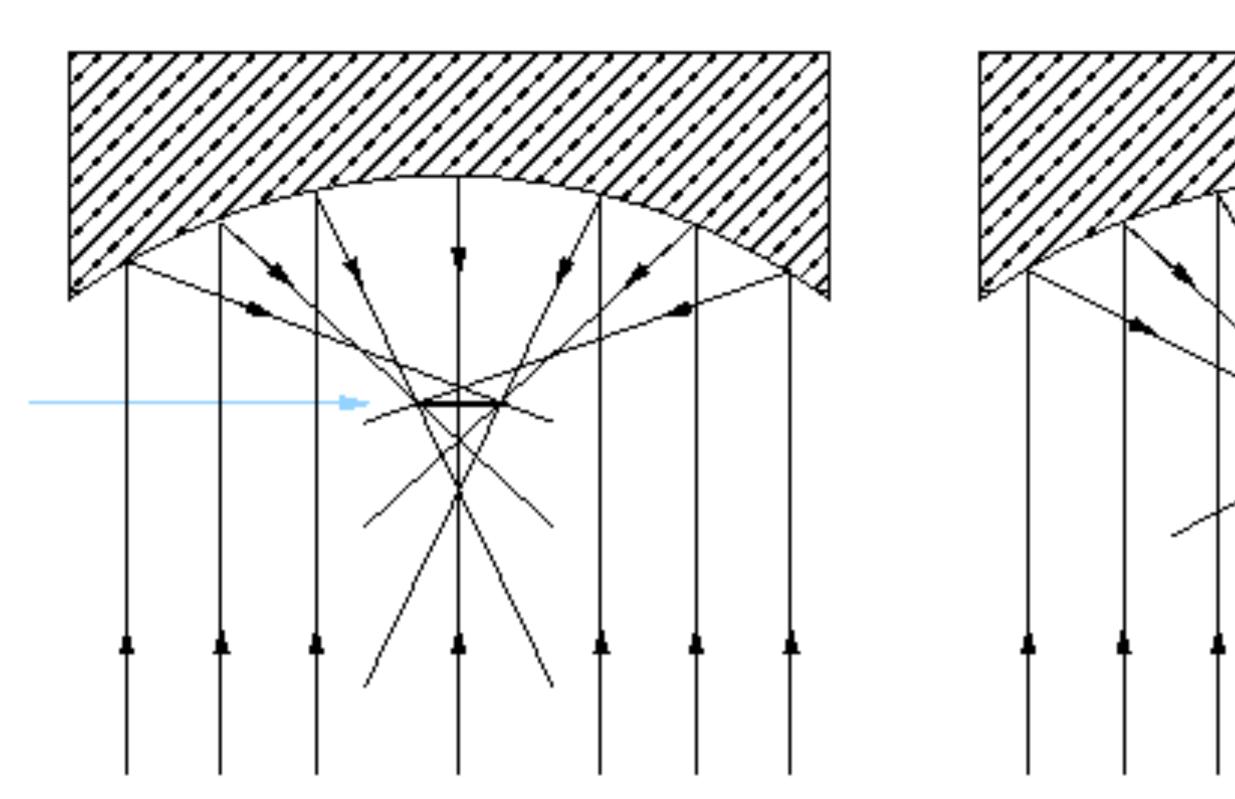






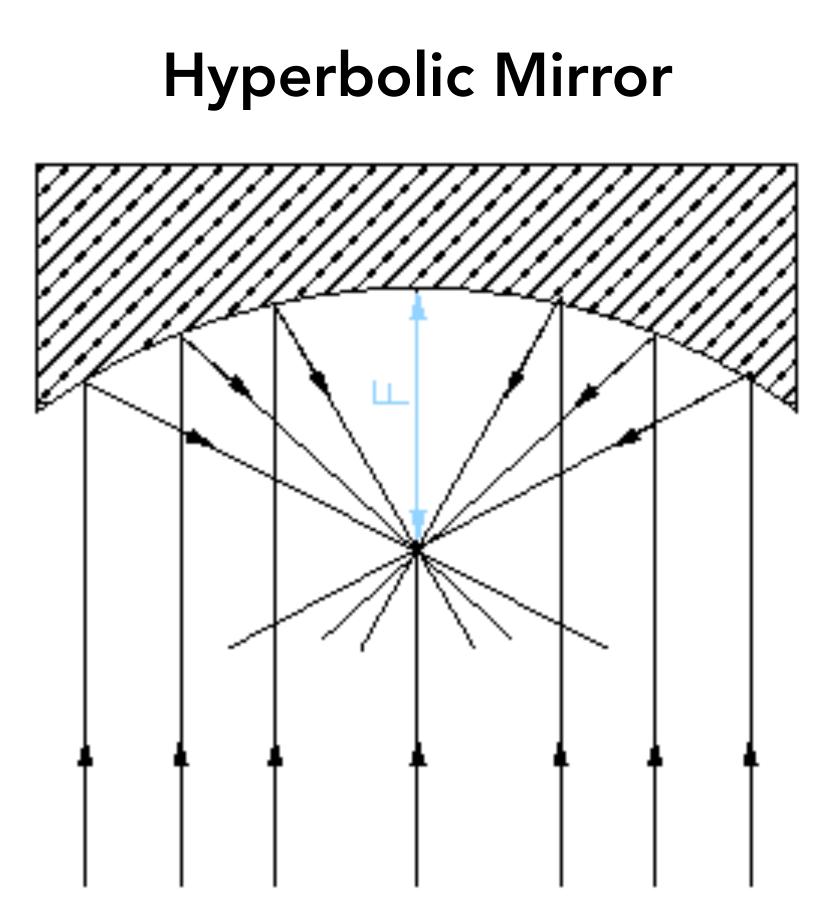
### **Spherical Aberration in Mirrors**

#### **Spherical Mirror**



https://www.telescope-optics.net/spherical1\_files/spherical1.htm http://www.vikdhillon.staff.shef.ac.uk/teaching/phy217/telescopes/phy217\_tel\_reflectors.html 66

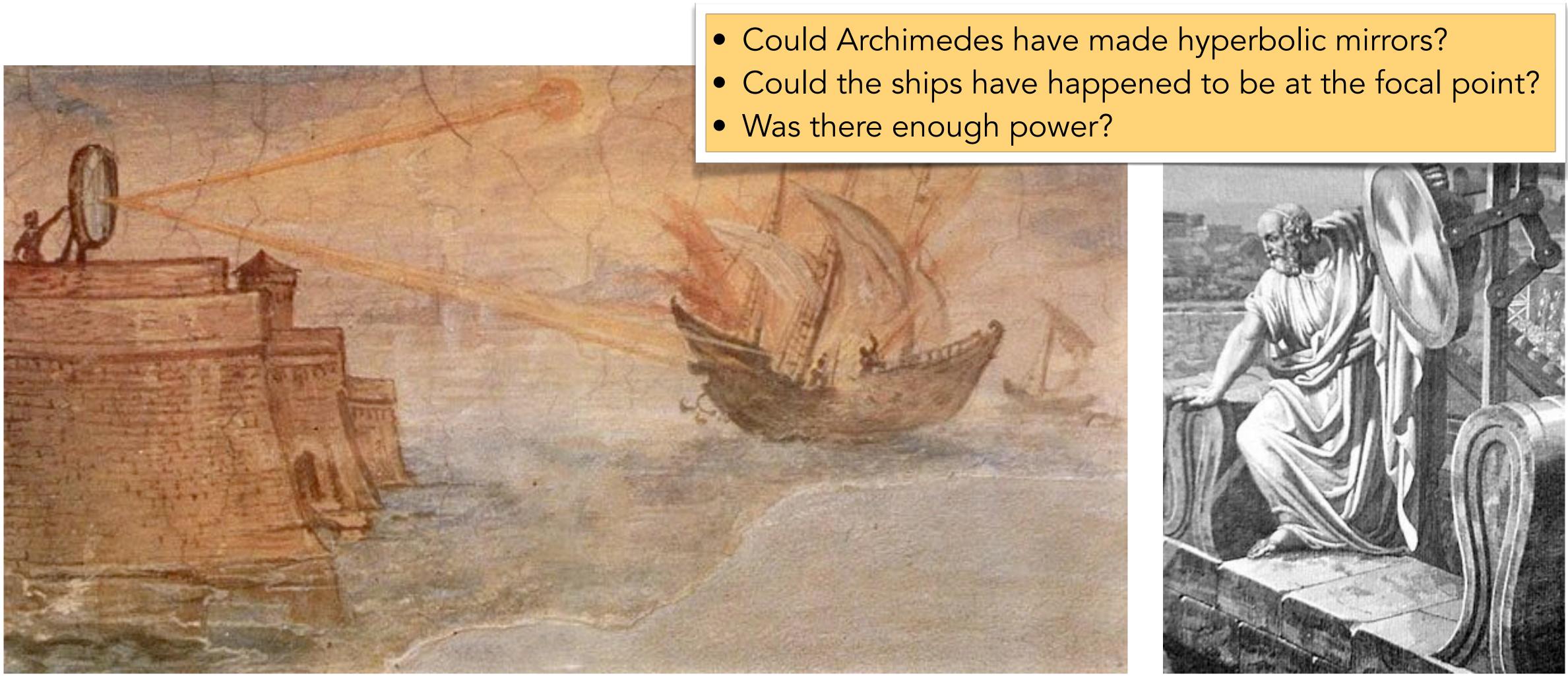








#### **Could It Have Been Possible?**

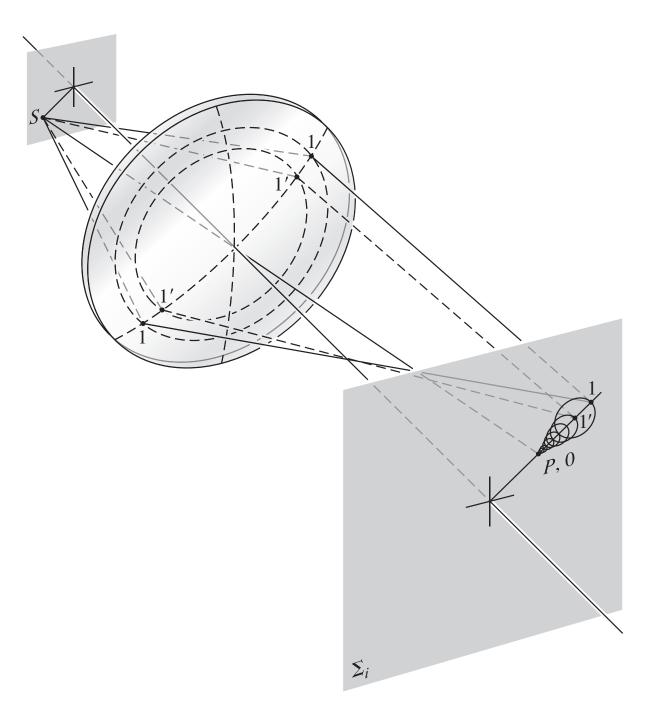


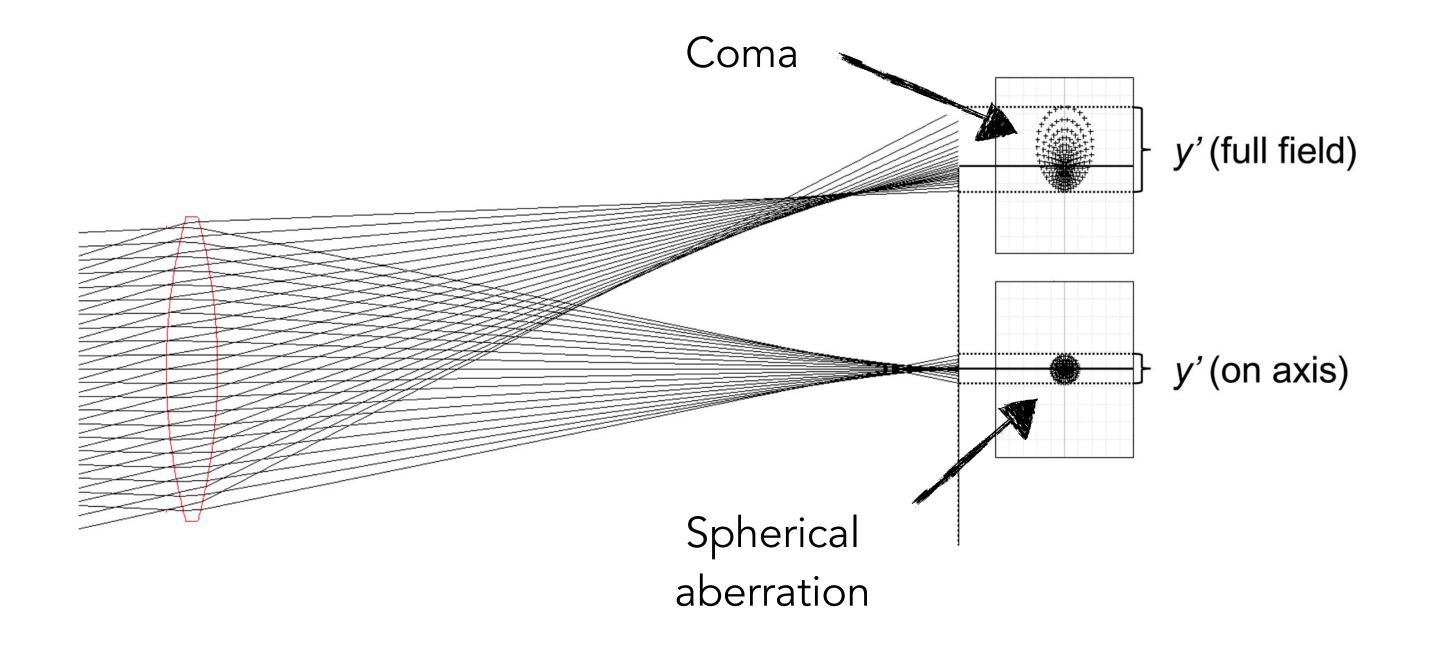
https://www.livescience.com/8383-study-archimedes-set-roman-ships-afire-cannons.html



#### Coma

#### Rays from an off-axis point focus on different points. By extension, parallel rays that are not parallel to the optical axis don't focus on the same point.

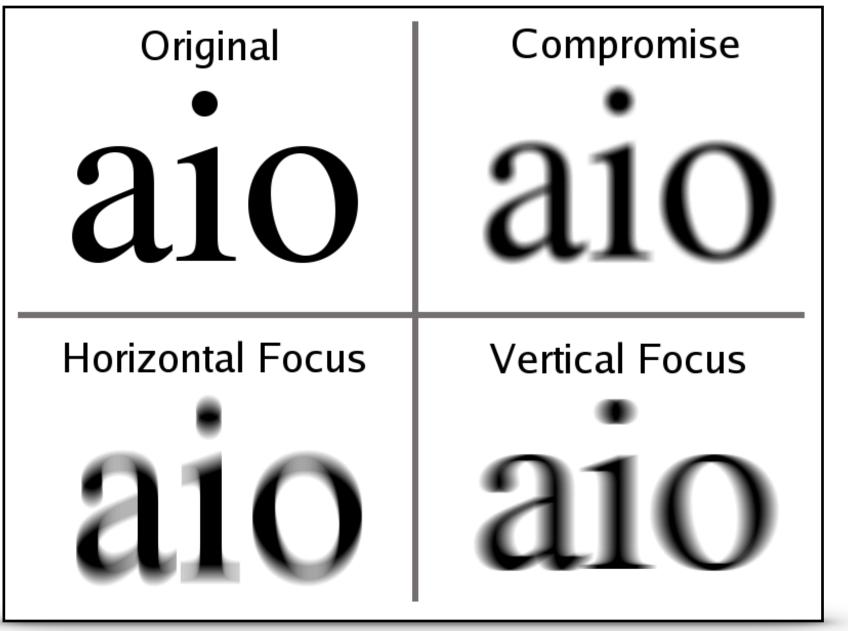


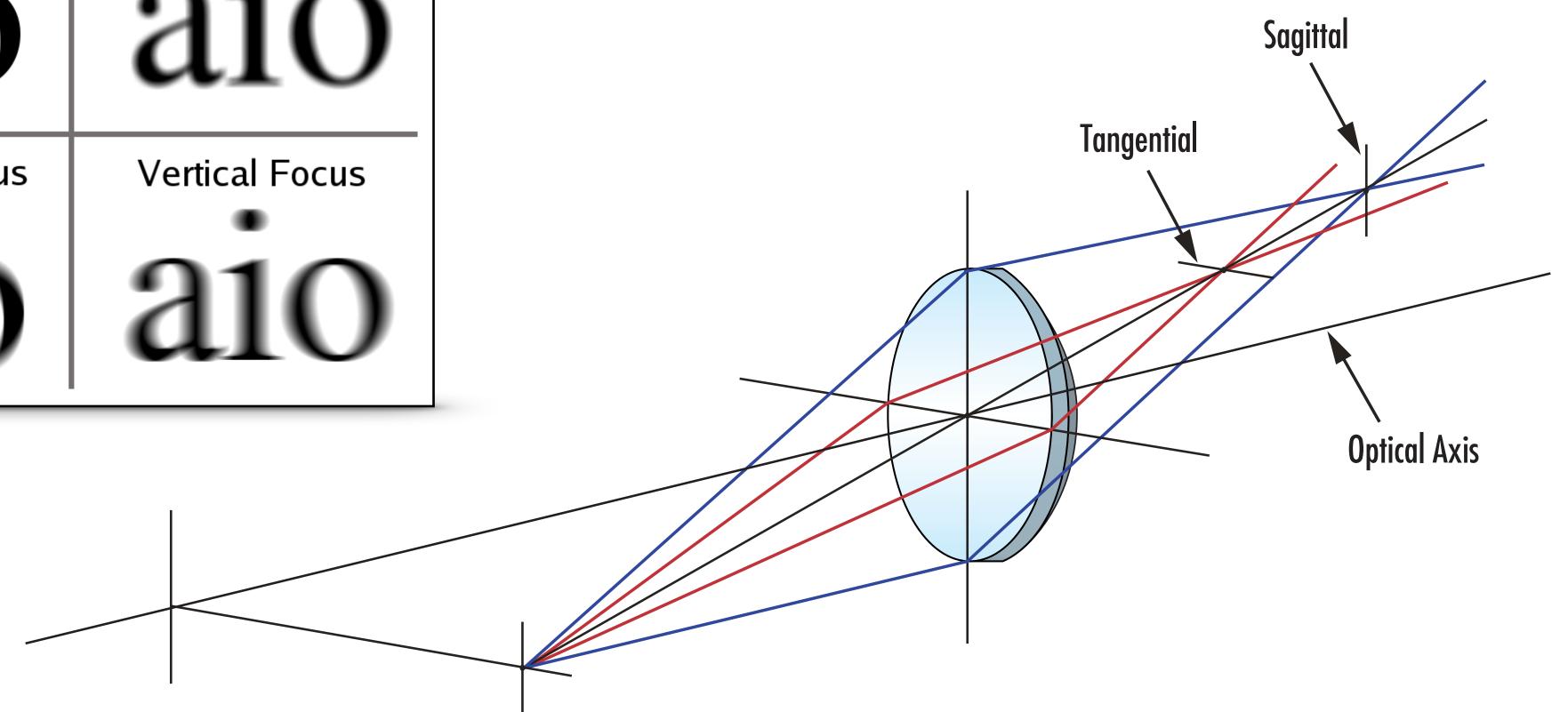






### Astigmatism



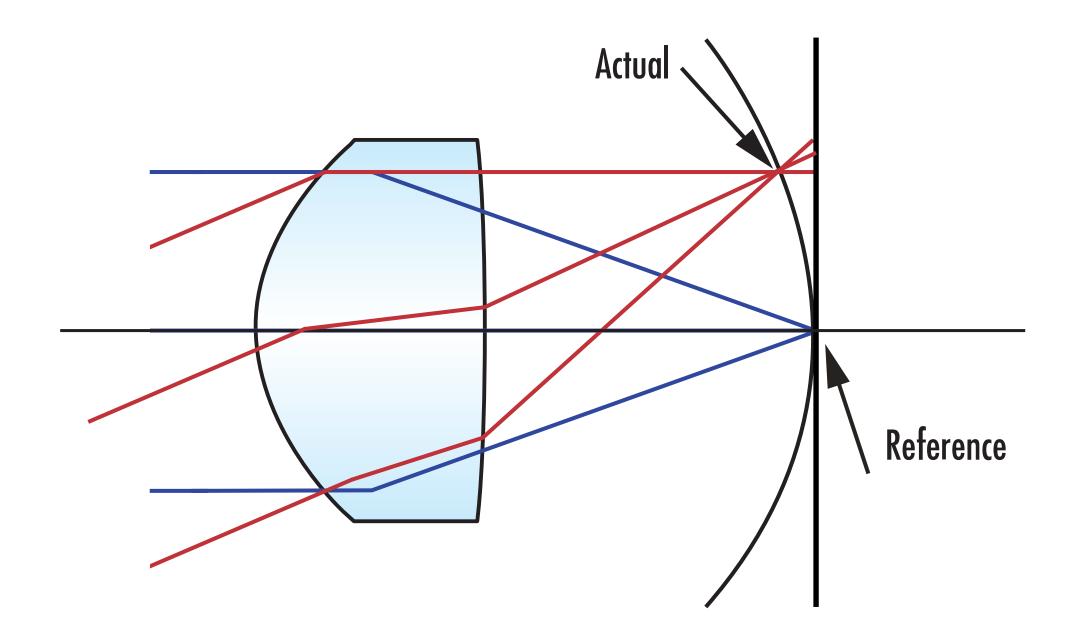


https://www.edmundoptics.com/knowledge-center/application-notes/imaging/how-aberrations-affect-machine-vision-lenses/ https://en.wikipedia.org/wiki/Astigmatism





#### **Field Curvature**



#### If a lens is free from all previous aberrations, a scene point is sharply imaged on a point on the sensor; but the image "plane" is actually a curved surface.



The image-sensor array of the Kepler space observatory is curved to compensate for the field curvature.

https://www.edmundoptics.com/knowledge-center/application-notes/imaging/how-aberrations-affect-machine-vision-lenses/



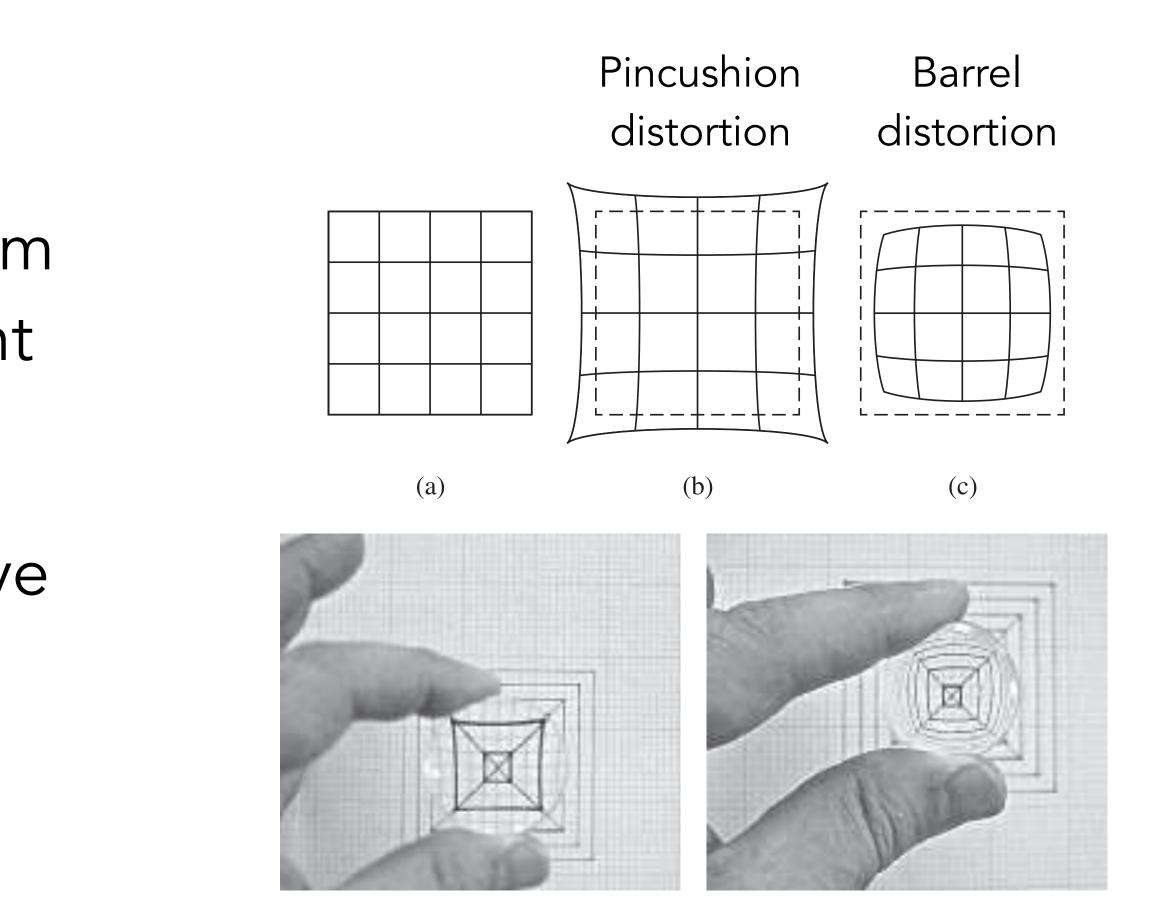


#### Distortion

Pinhole cameras and ideal lens perform perspective projections, where straight lines remain straight in images.

Distortion is deviation from perspective projection. It is more significant at the extremities of the lens.

Fisheye lens is an extreme example.



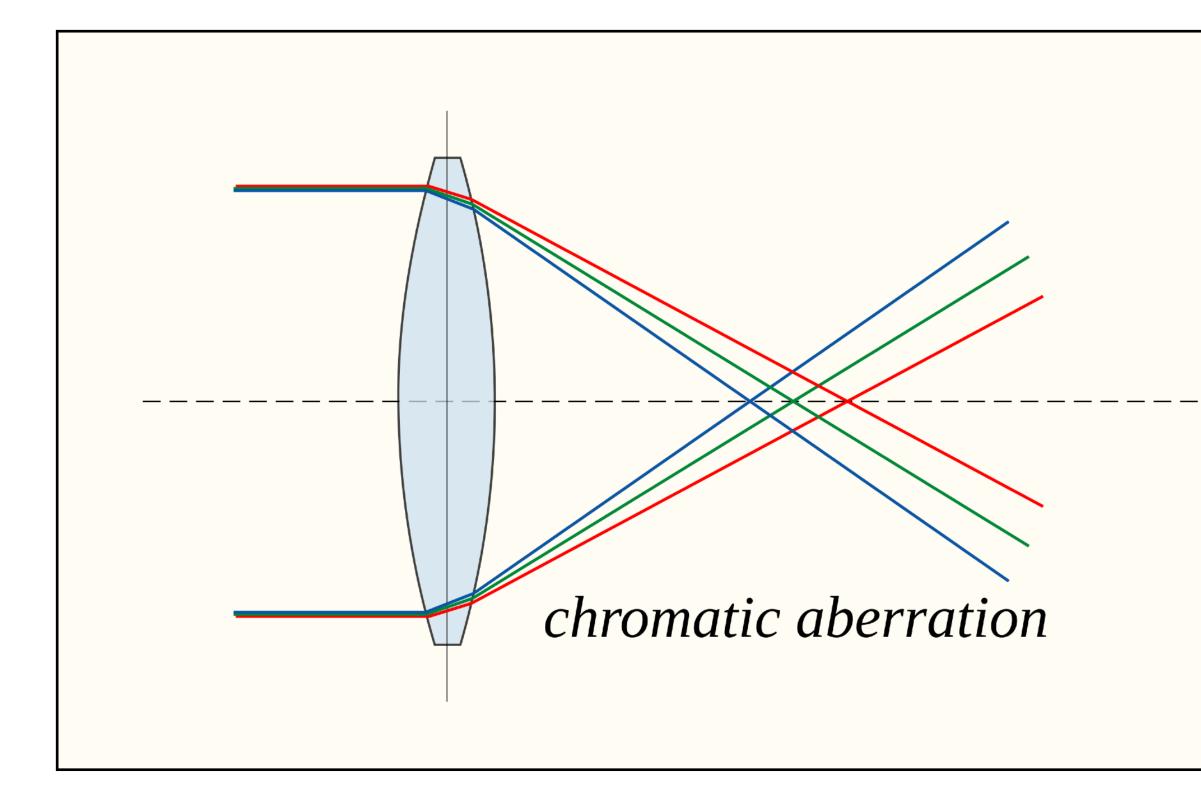
(d)

(e)

**Figure 6.34** (*a*) Undistorted object. (*b*) When the magnification on the optical axis is less than the off-axis magnification, pincushion distortion results. (*c*) When it is greater on axis than off, barrel distortion results. (*d*) Pincushion distortion in a single thin lens. (*e*) Barrel distortion in a single thin lens. (*E*.H.)

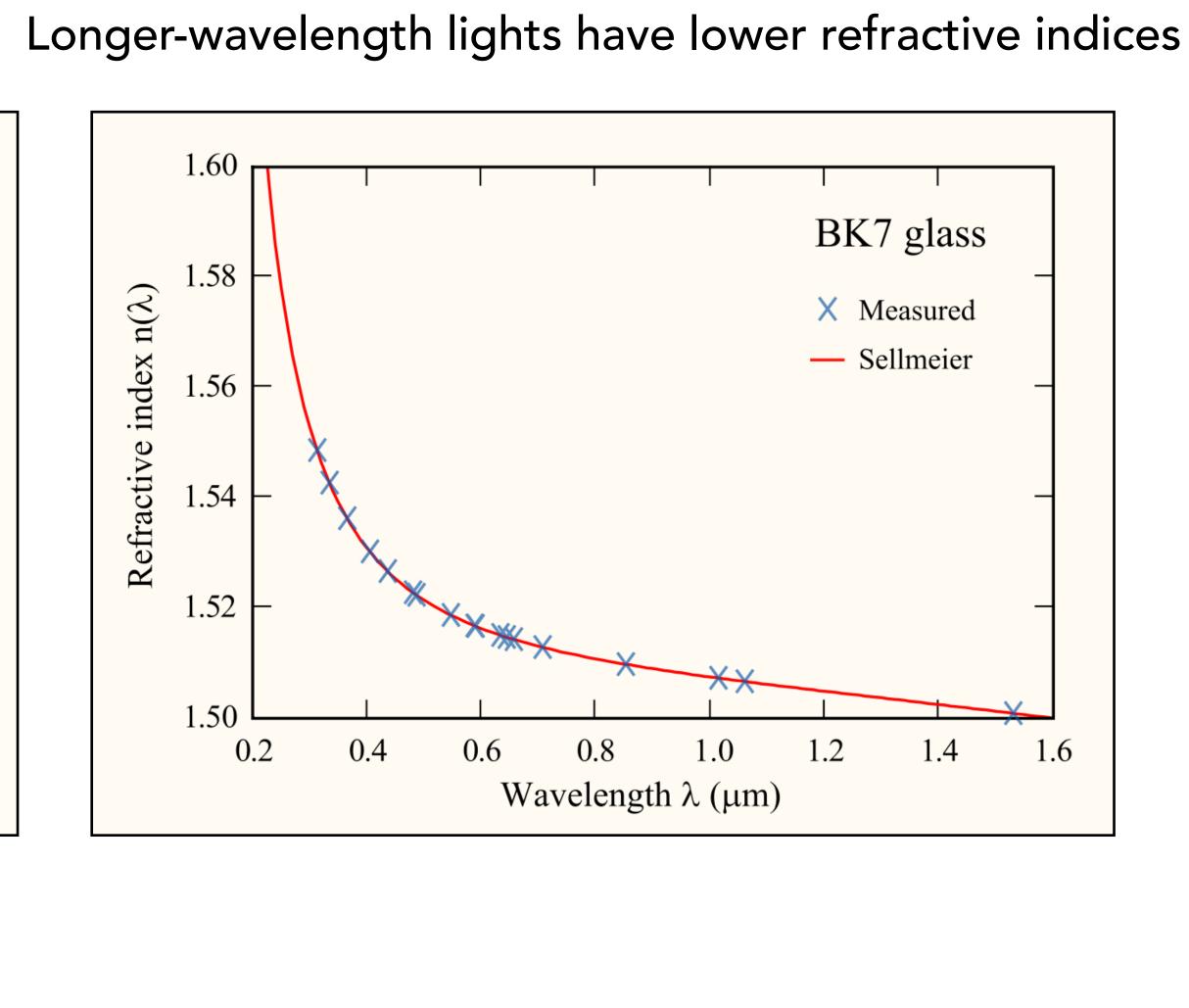


#### **Chromatic Aberration**



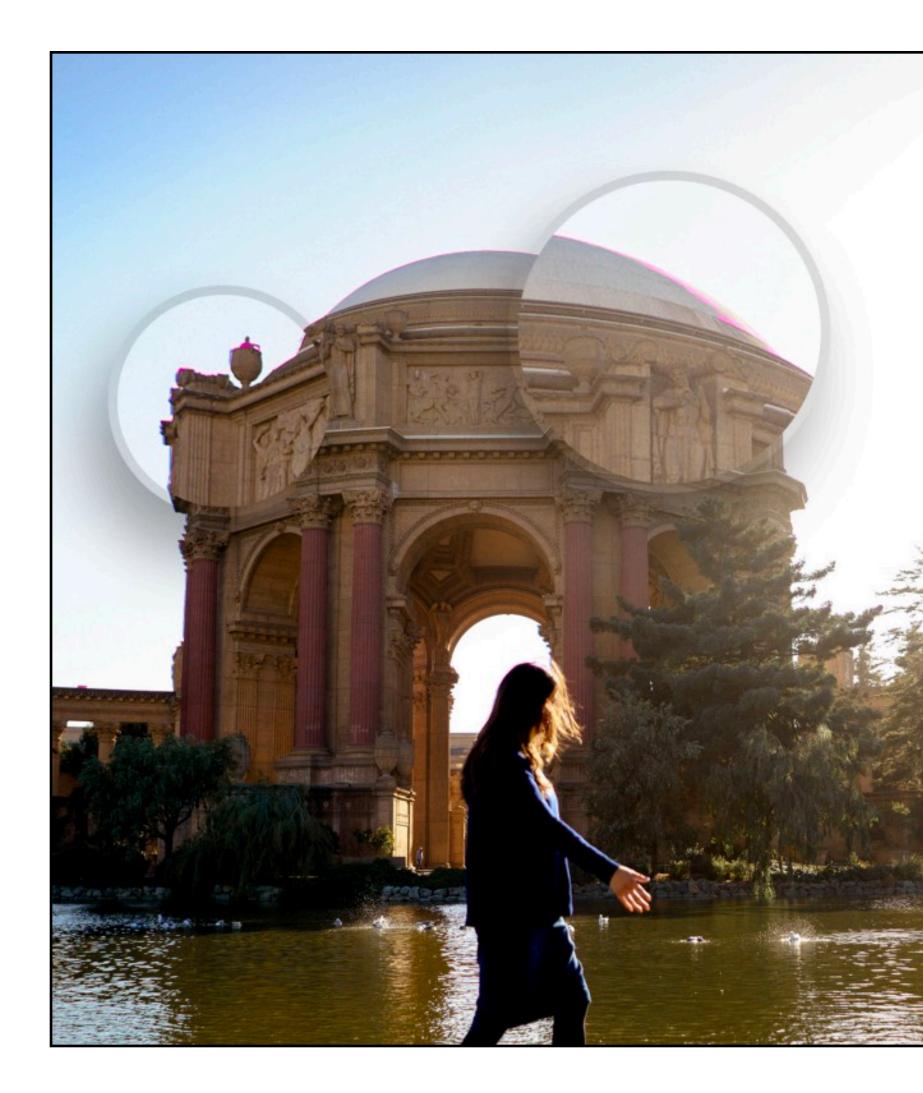
https://en.wikipedia.org/wiki/Chromatic\_aberration 72 https://news.smugmug.com/what-is-chromatic-aberration-how-do-i-deal-with-it-26d5a55c0924

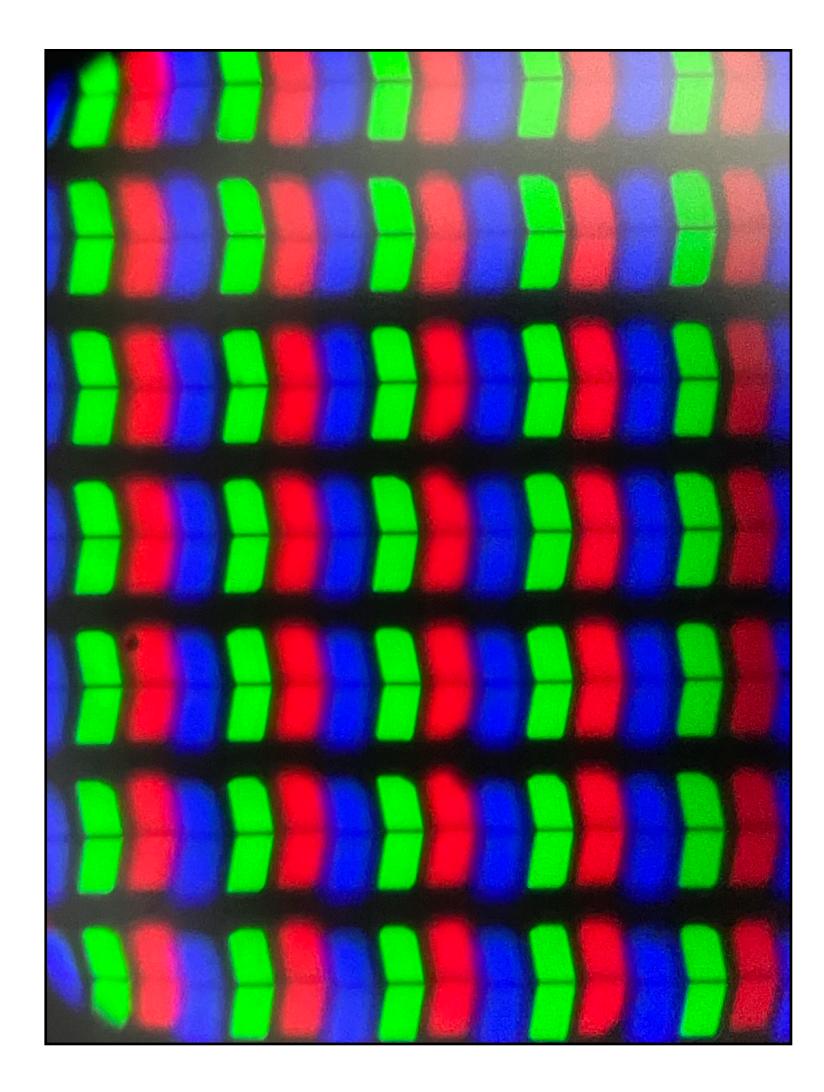






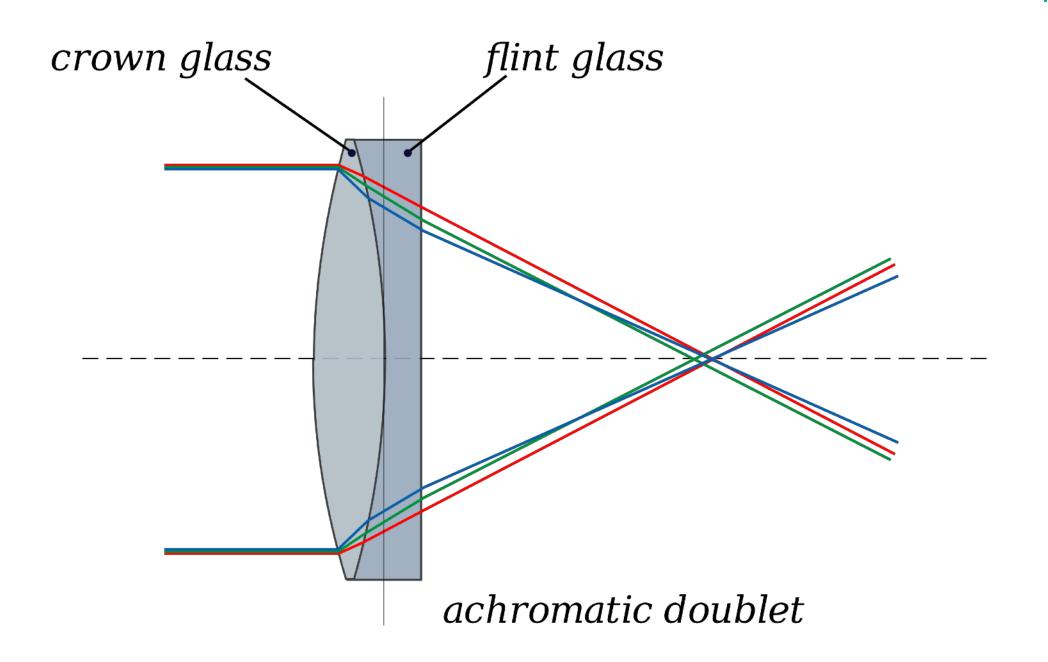
### **Chromatic Aberration**

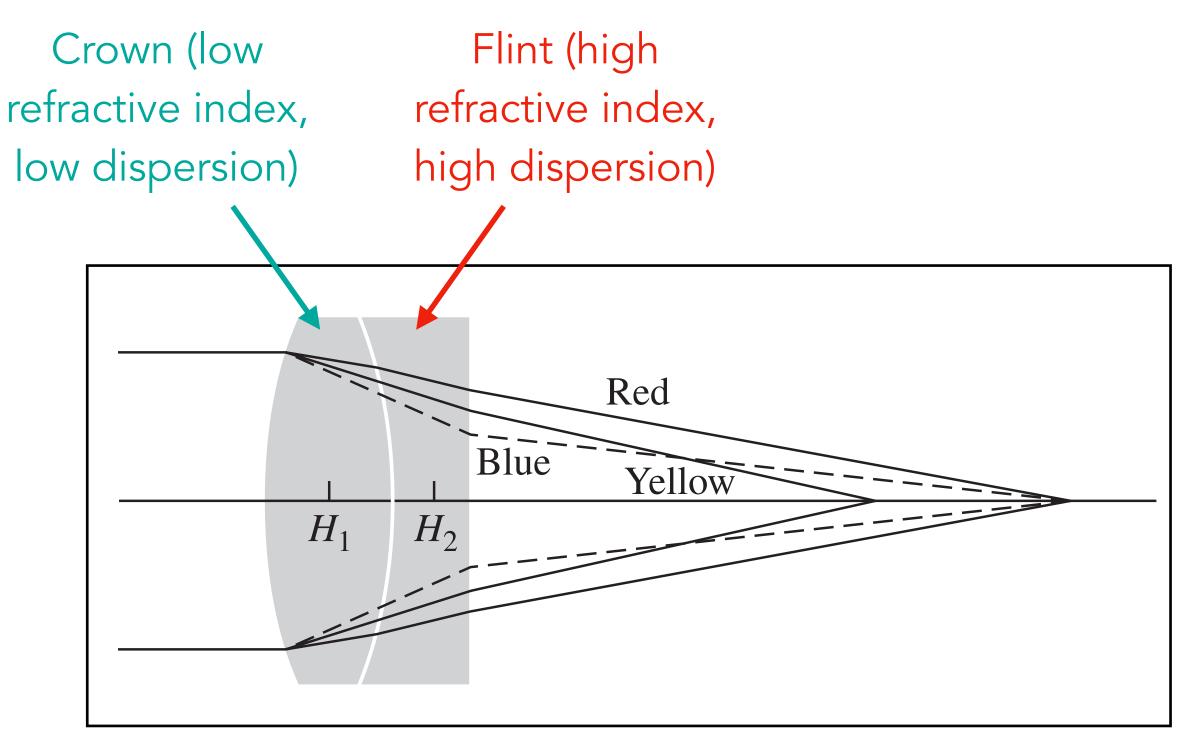






# Fixing Chromatic Aberration: Achromatic doublets







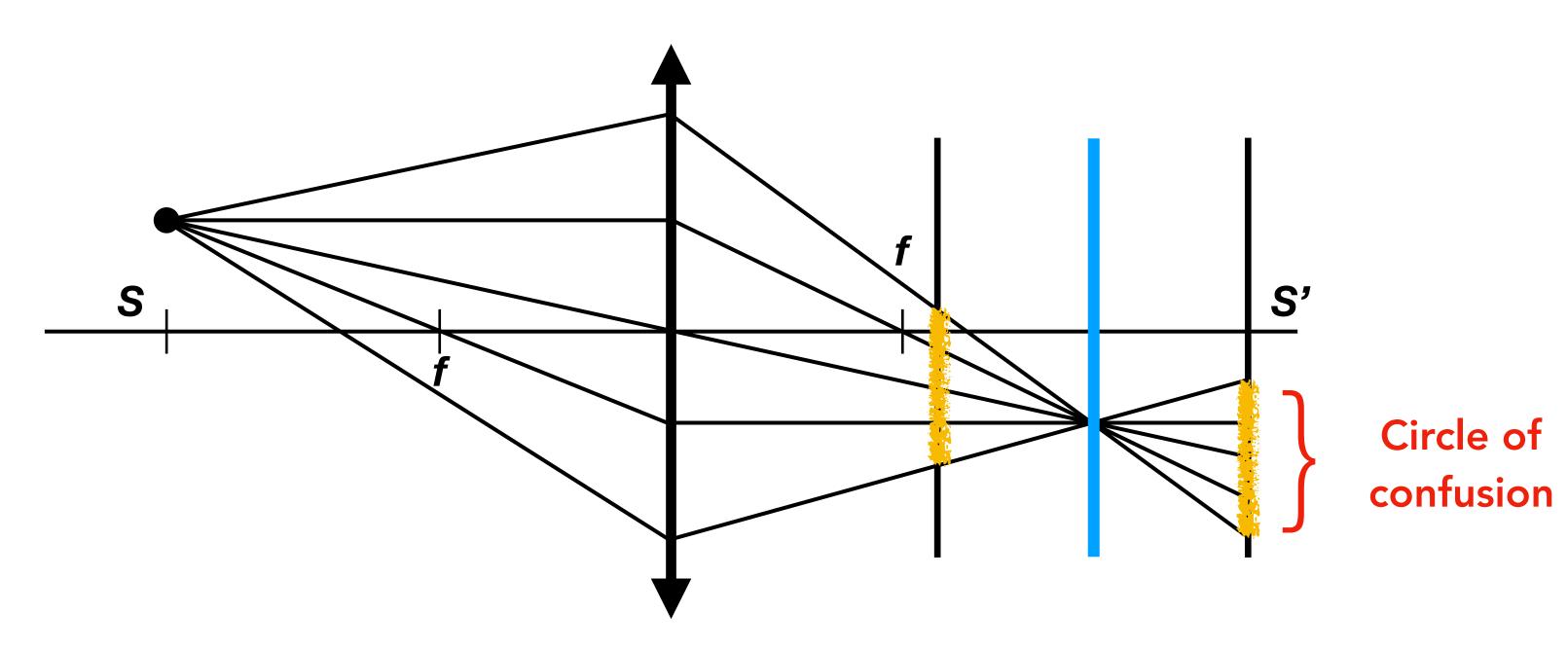
# Depth of Field



## **Defocus Blur**

If CoC is greater than a threshold, the point appears blur.

- Multiple pixels get some rays from that point
- Blur from defocus; c.f. motion blur



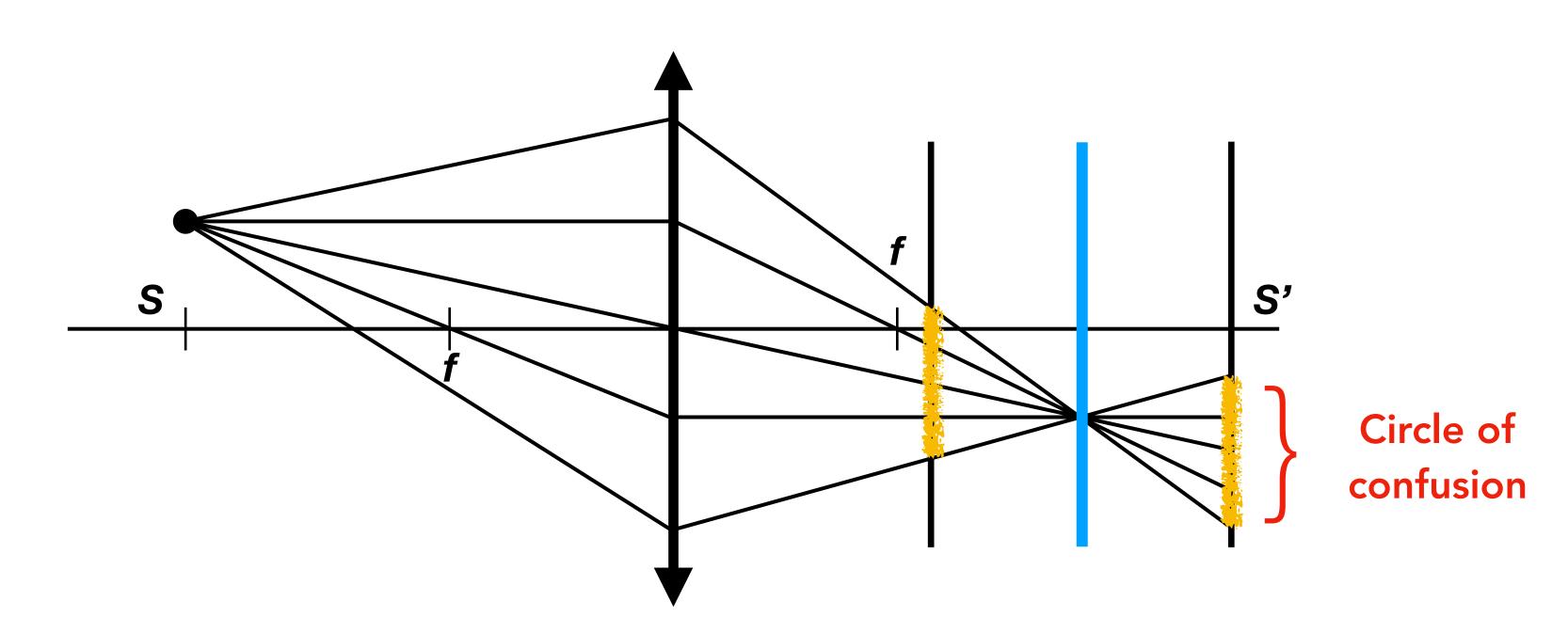
#### e point appears blur. point



### Bokeh

Bokeh is the size of an out-of-focus/defocused point.

Shape of bokeh is ~shape of the aperture.







https://en.wikipedia.org/wiki/Bokeh 78







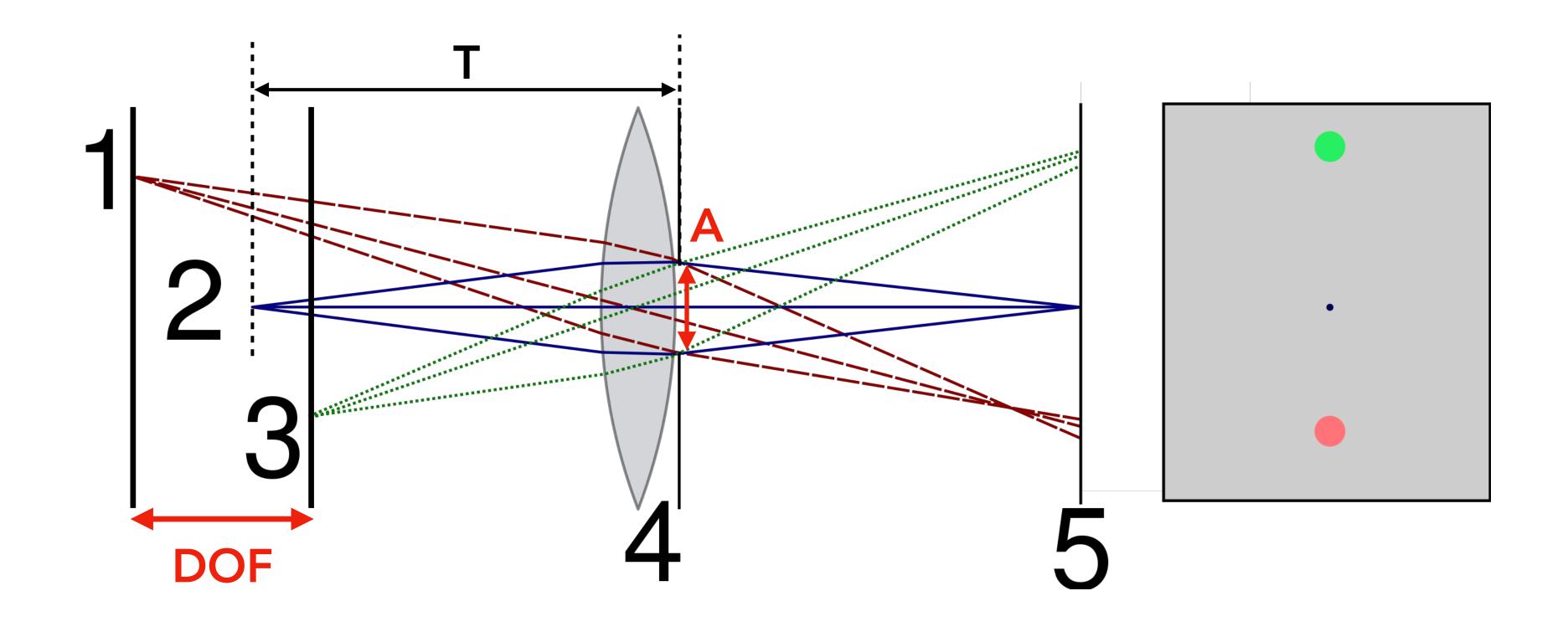






# **Depth of Field**

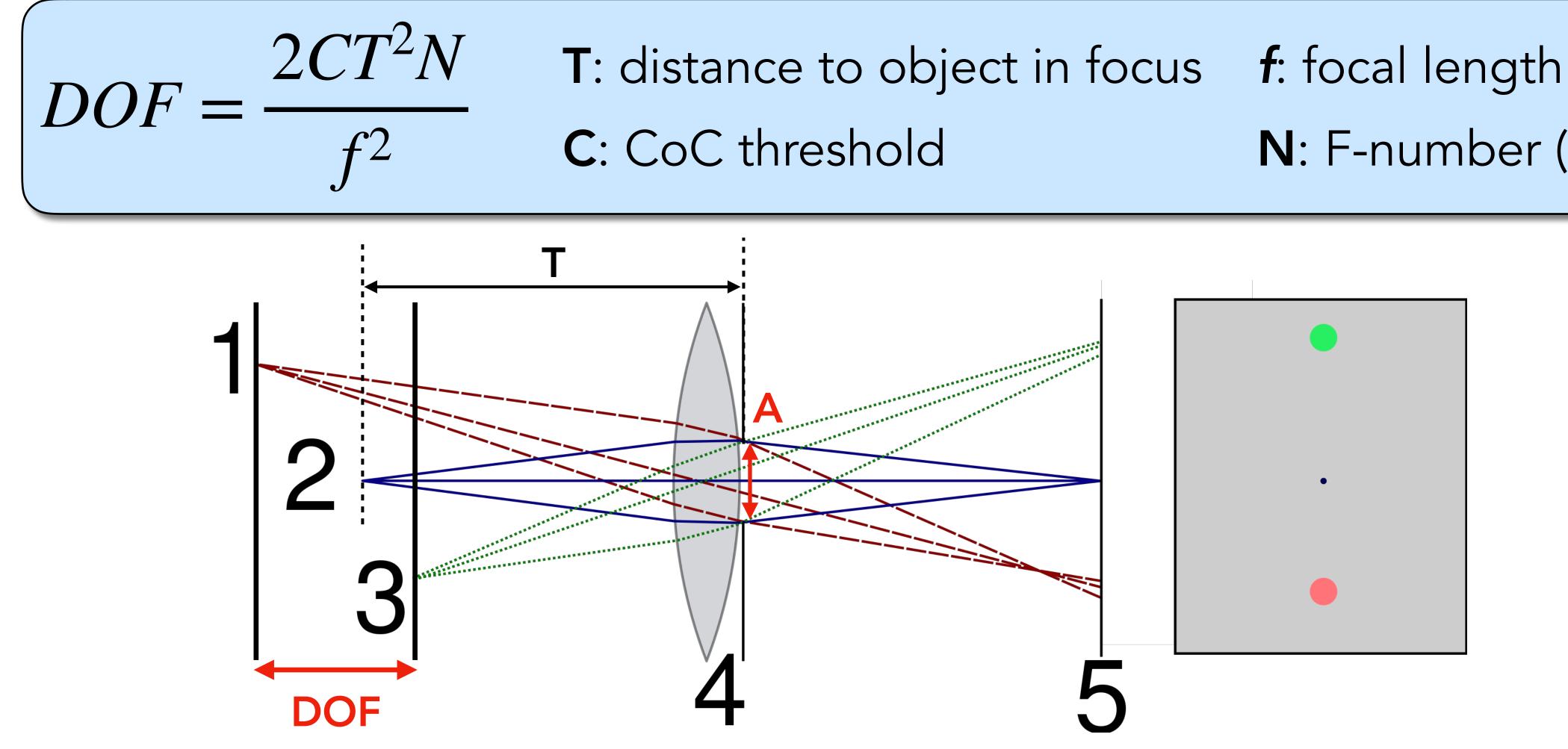
and farthest scene points that will be in focus?



# Given that the sensor is focused on objects at distance T, what are the nearest



## **Depth of Field**



\* Note: you can infer T from f and the lens-sensor distance given a camera, but from f alone we can't infer T.

# N: F-number (f/A)





### **F-Number**



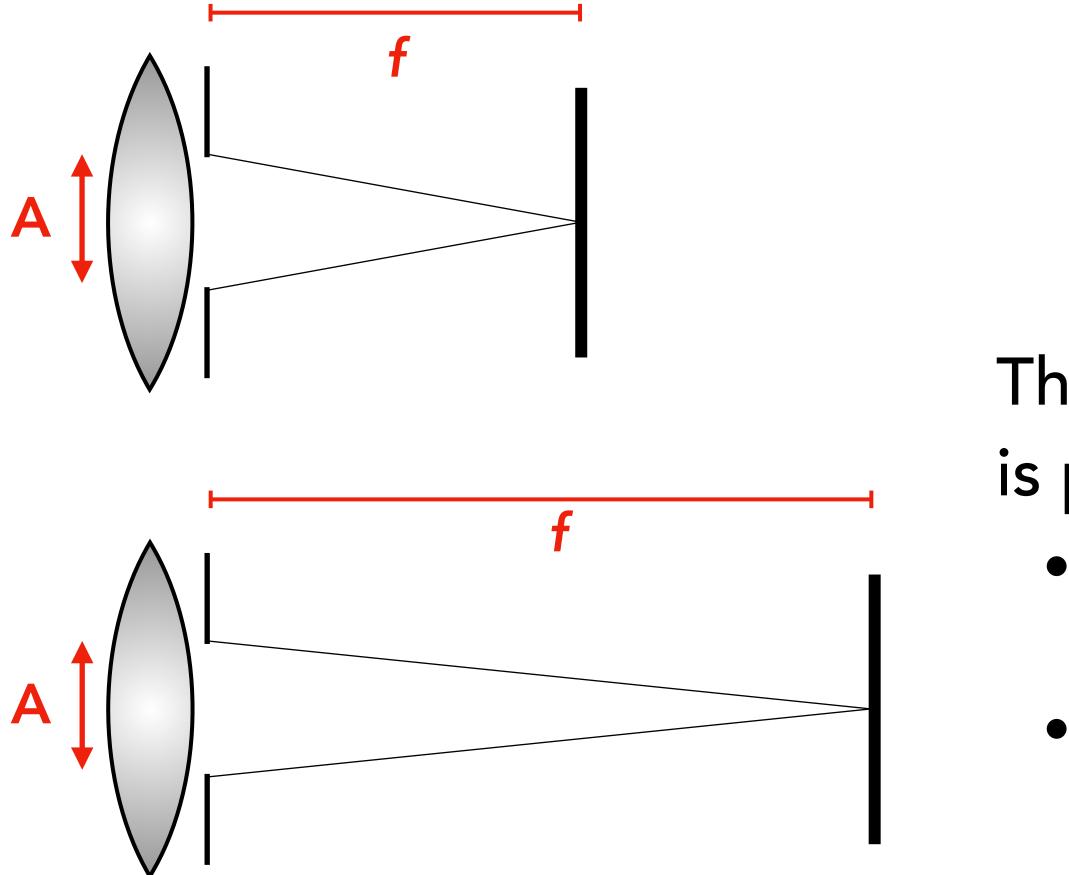
https://photobizblog.files.wordpress.com/2013/02/aperture.jpg http://sonyaddict.com/2019/09/02/7artisans-35mm-f-1-4-now-available/

### focal length A





## Why F-Number is So-Defined?



# focal length \_ aperture size

The irradiance of a pixel (photons per area) is proportional to:

• 1. square of aperture size A (the amount of photons that are allowed through)

• 2. inverse square of the focal length (remember irradiance falls off quadratically with distance)

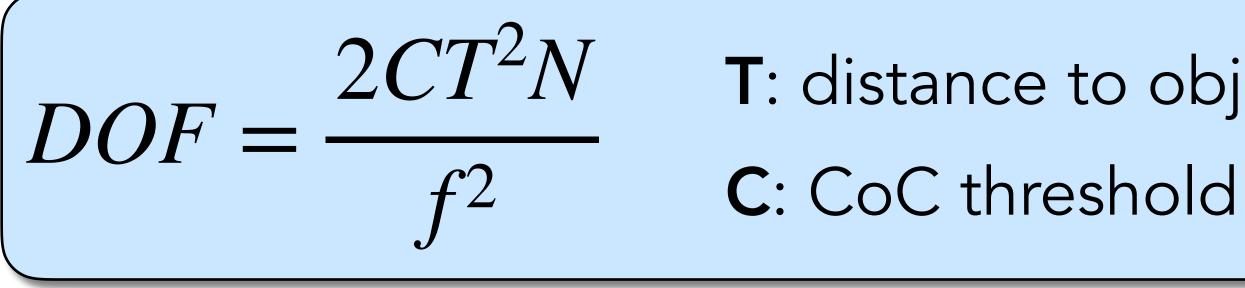
• So pixel irradiance  $\sim = 1/N^2$ 







### How to Increase DOF?



1. Focus on farther away (e.g., landscape)

# T: distance to object in focus f: focal length C: CoC threshold N: F-number (f/A)





# A large T

https://markdenneyphotography.com/blog

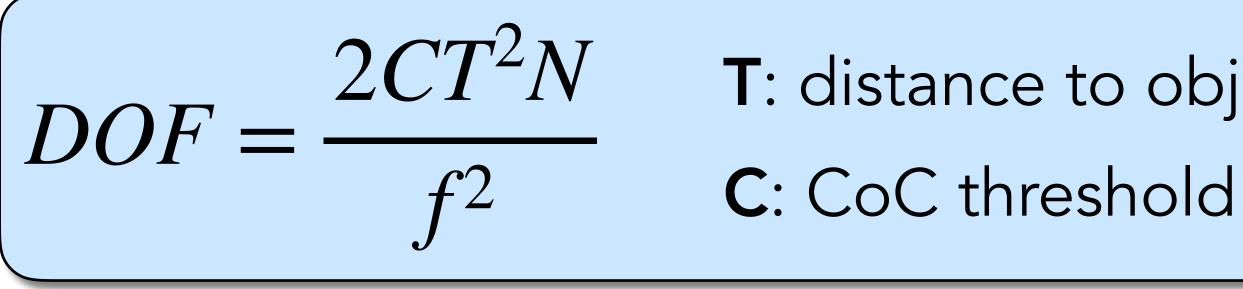
CALLER BEARING







### How to Increase DOF?



- 1. Increase T: focus on farther away (e.g., landscape)
- 2. Reduce A: use a large F-number (smaller aperture)

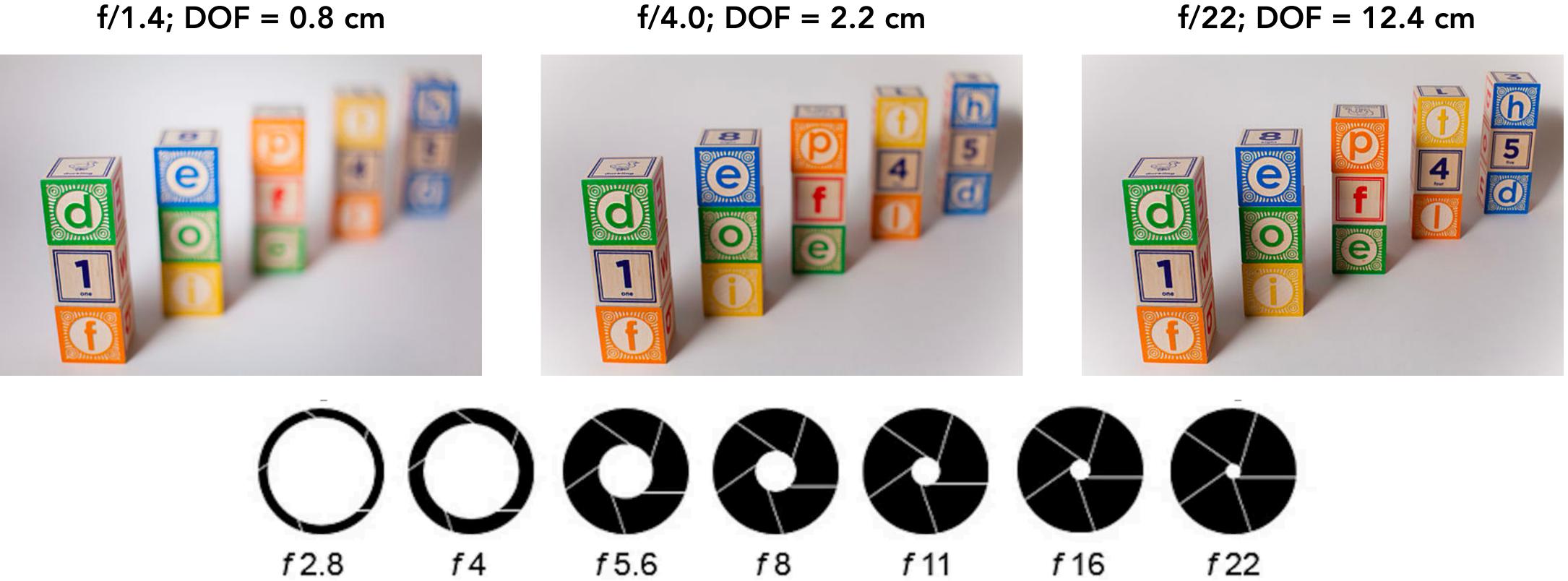
# T: distance to object in focus f: focal length C: CoC threshold N: F-number (f/A)





## Small Aperture Increases DOF

#### $A \downarrow$ ; F-Number 1; DOF 1



#### f/4.0; DOF = 2.2 cm

#### f/22; DOF = 12.4 cm

https://en.wikipedia.org/wiki/Depth\_of\_field







f/16



f/4

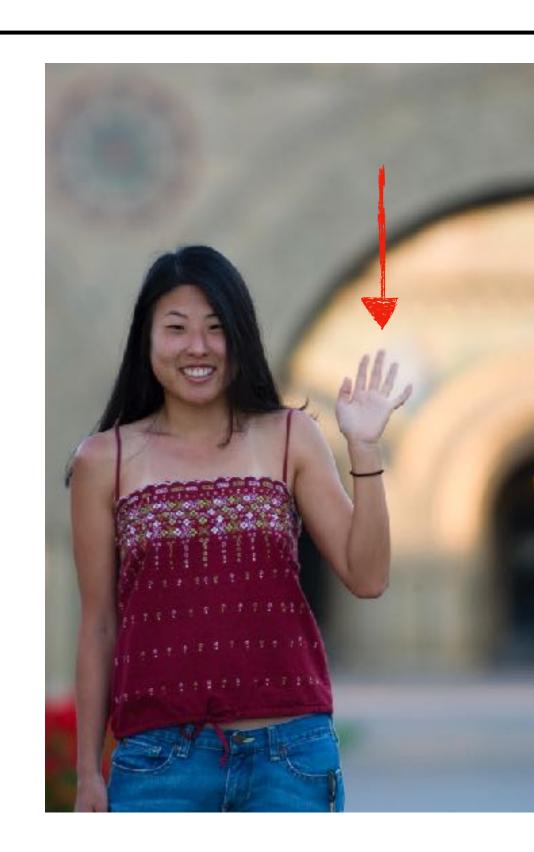
f/1.4



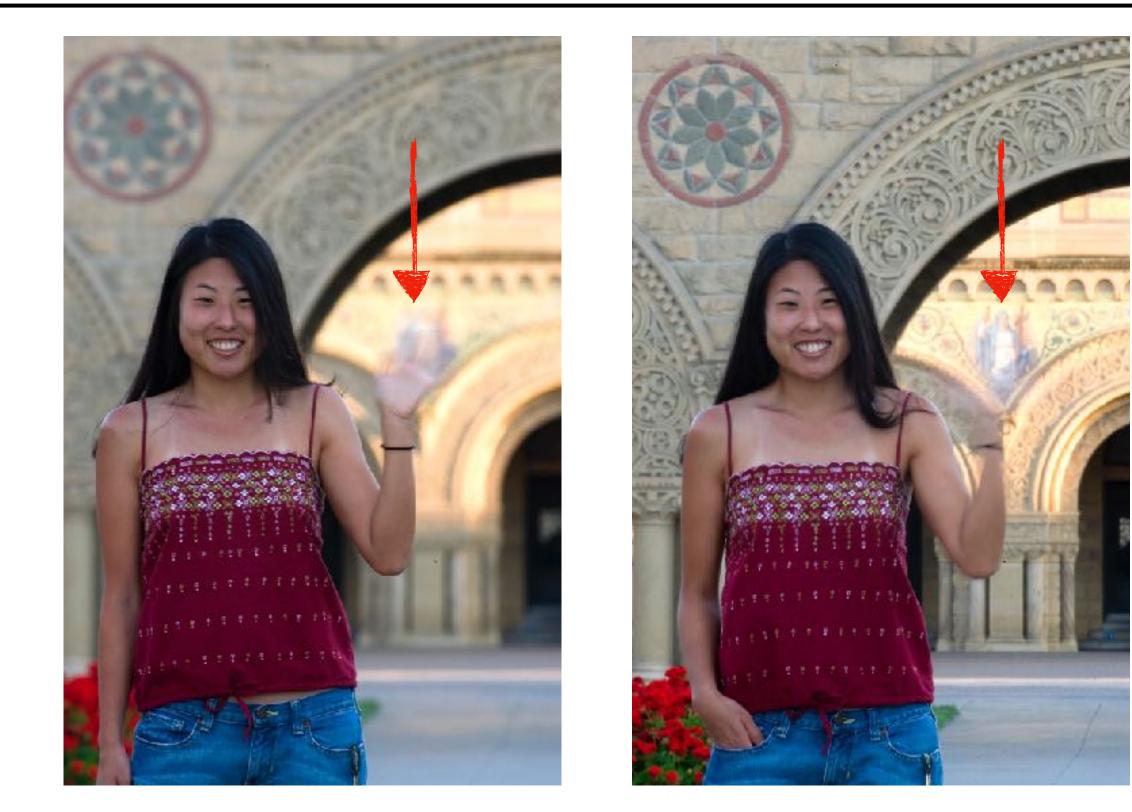


## **Motion Blur vs. DOF Trade-off**

A small aperture increases the exposure time and motion blur.

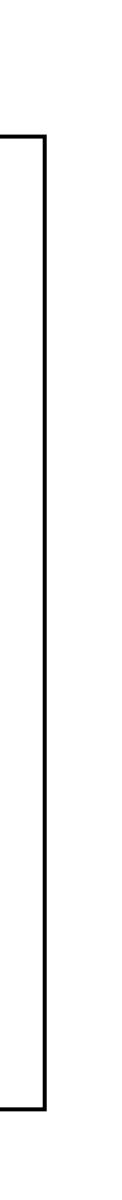


f / 4 1/125 sec



f / 11 1/15 sec

f / 32 1/2 sec







# Large Apertures for Small DOFs

Large DOF is not always desirable

• Portrait photography needs a small (shallow) DOF, which requires a large aperture.

Smartphone cameras can't have a large aperture. Computational photography to the rescue

• "synthesis depth of field"



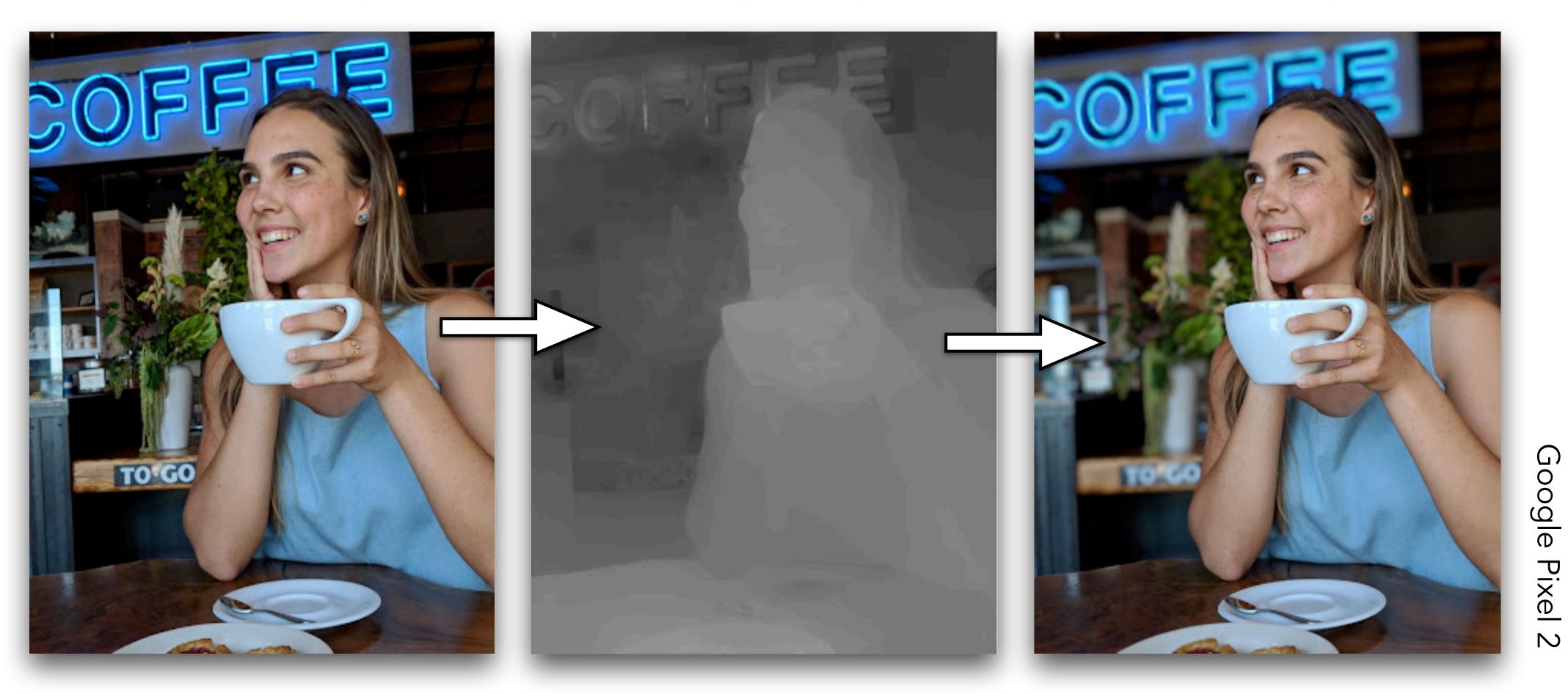
https://ai.googleblog.com/2017/10/portrait-mode-on-pixel-2-and-pixel-2-xl.html 91





# Synthetic Depth of Field

Shot an all-in-focus photo



#### Estimate pixel depths

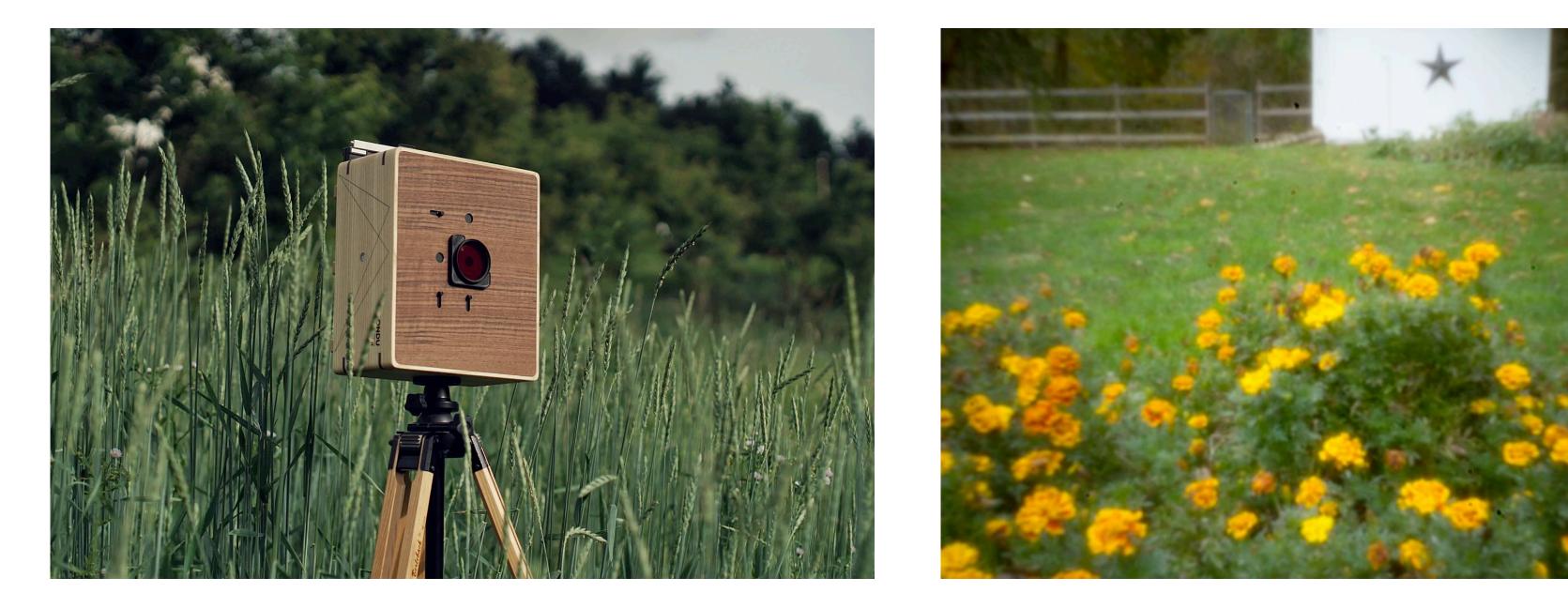
#### Blur background pixels



# **DOF of a Pinhole Camera**

- A pinhole camera effectively has an infinite depth of field.
  - Ideal pinhole camera is a special camera with an infinitesimal aperture.
  - pinhole size is large.

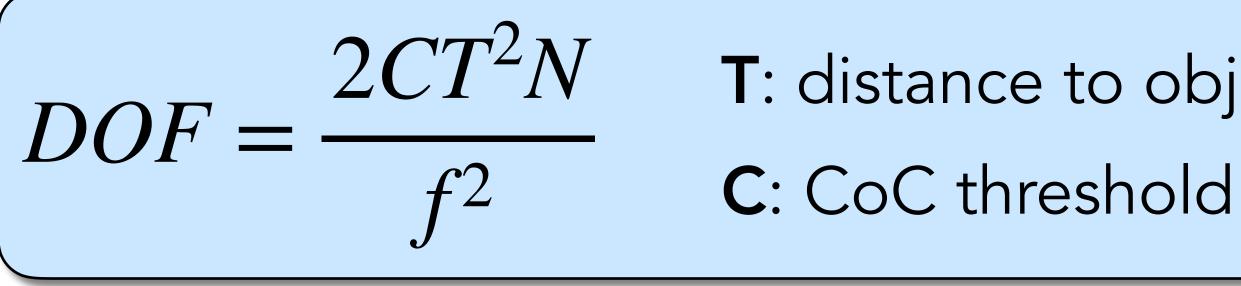
$$DOF = \frac{2CT^2N}{f^2}$$
$$N = \frac{f}{A}$$



• Everything is in-focus; each point has only one ray reaching the sensor — unless the



### How to Increase DOF?



- 1. Increase T: focus on farther away (e.g., landscape)
- 2. Reduce A: use a large F-number (smaller aperture)
  - Affects exposure time (motion blur)
- 3. Decrease f: shorter focal length
  - Just remember that f affects magnification and field of view too.

#### **T**: distance to object in focus f: focal length N: F-number (f/A)





Making Use of Blur



## **Motion Blur vs. Defocused Blur**



https://pixabay.com/id/photos/kabur-mengaburkan-kedalaman-lapangan-193817/ https://www.formula1.com/en/latest/article.were-better-than-10th-says-frustrated-ricciardo-as-he-vows-to-make-it-happen.5BsABn0Xuu0nwH4BPIaP4H.html 96





## Infer Speed from Motion Blur



1. Translate # of pixels to distance on the sensor using pixel size.

2. Translate the distance on sensor to the distance in the scene (depends on the scene depth).

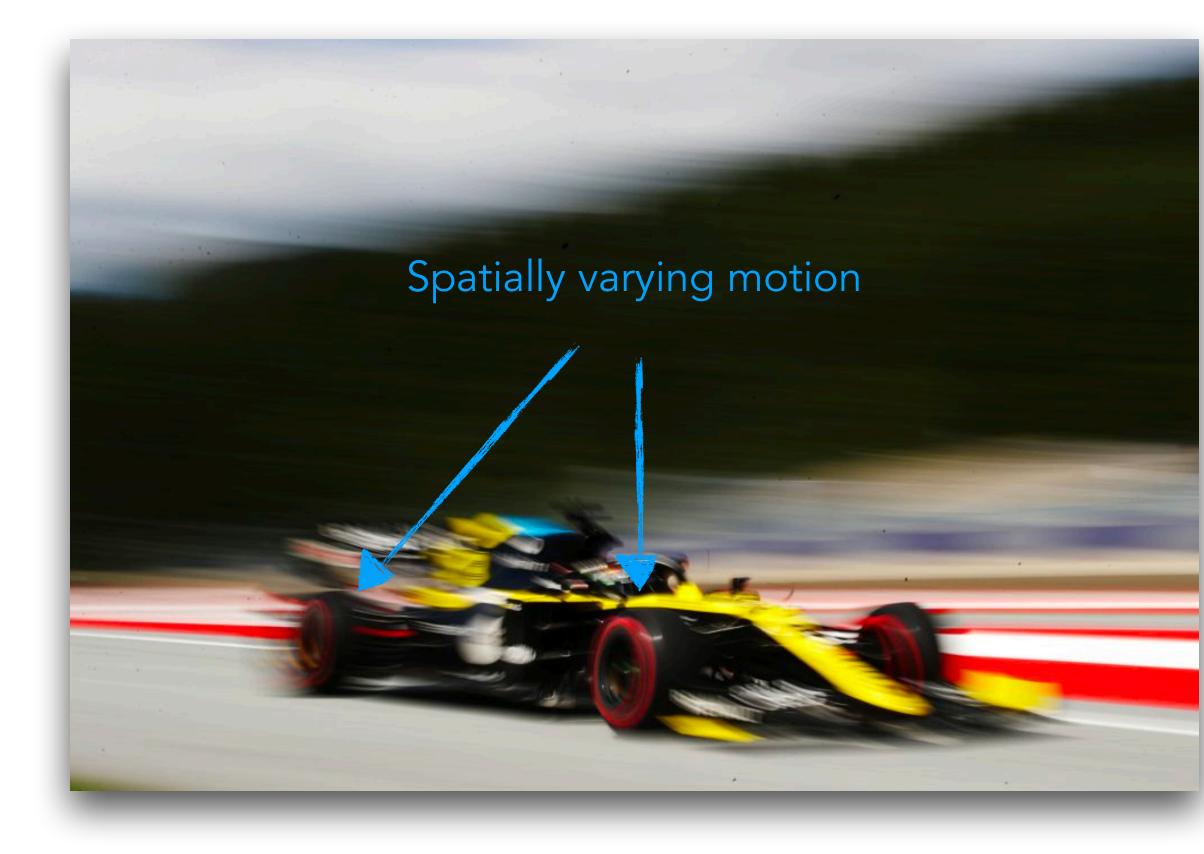
3. Use exposure time to estimate the object speed.

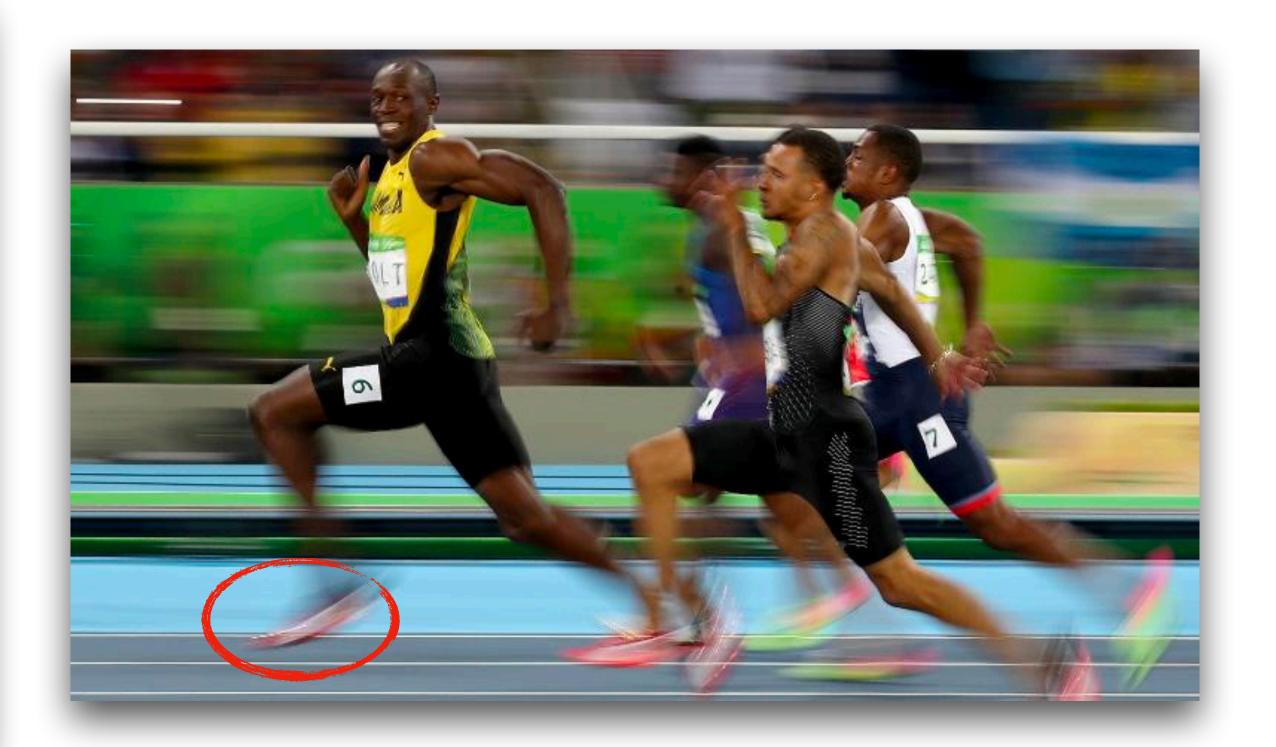






# Motion from Blur Challenges





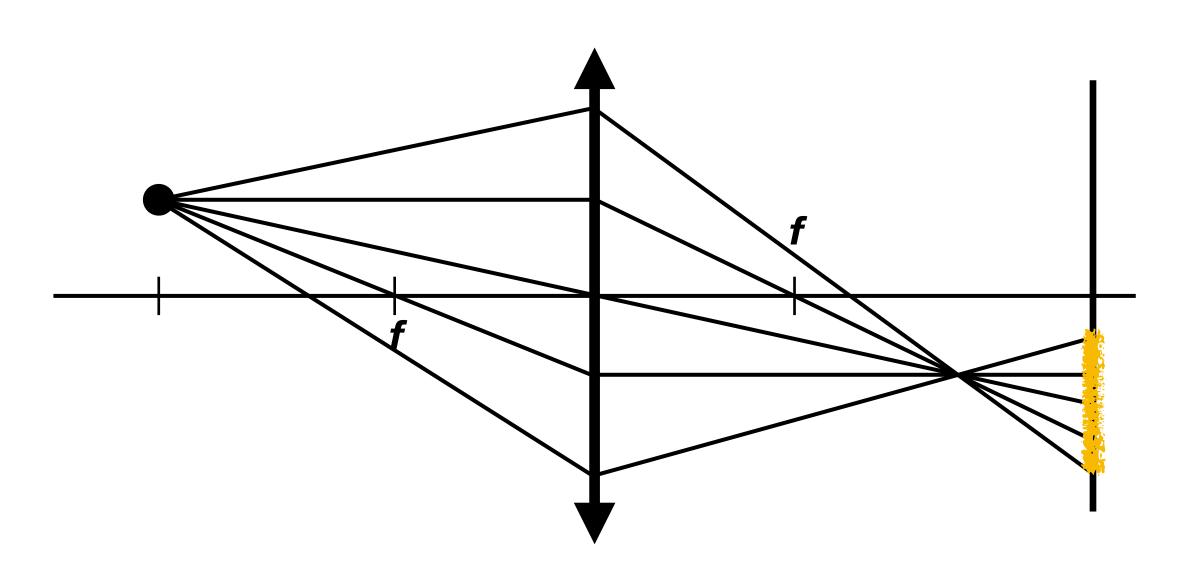
#### **Non-linear motion**

https://www.formula1.com/en/latest/article.were-better-than-10th-says-frustrated-ricciardo-as-he-vows-to-make-it-happen.5BsABn0Xuu0nwH4BPIaP4H.html





### **Depth From Defocused Blur**



Scene depth is proportional to the CoC size.





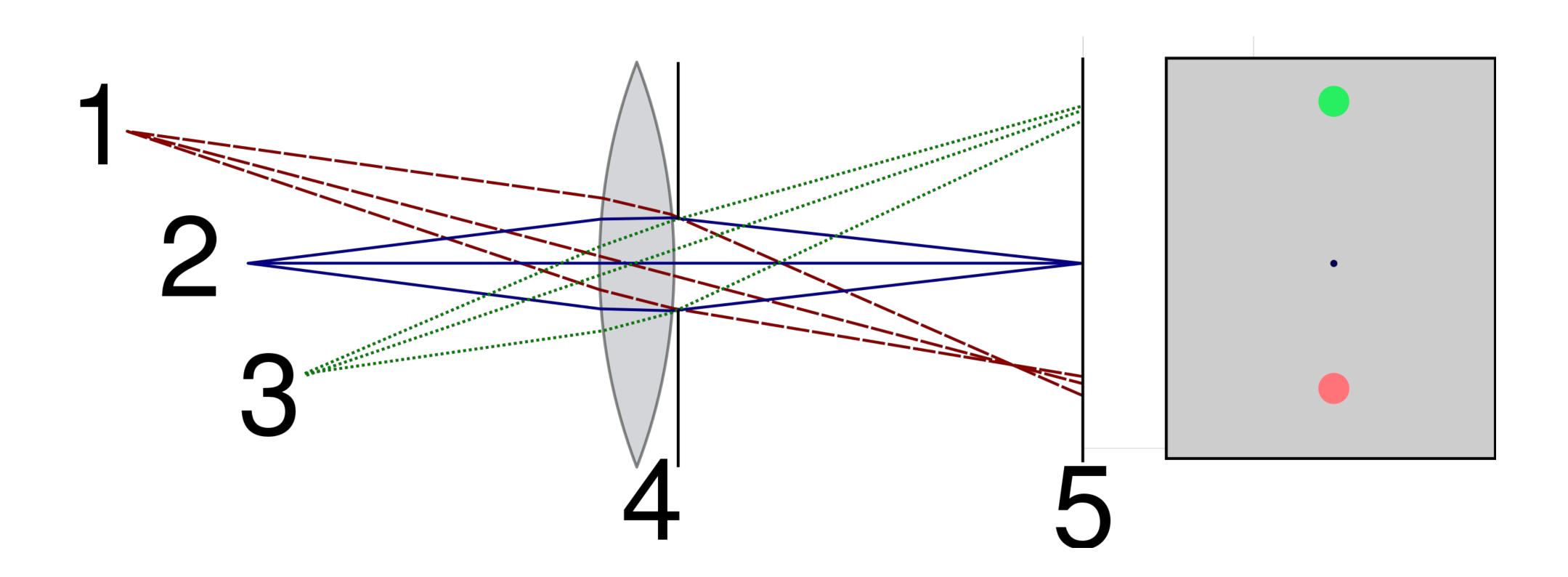
https://www.formula1.com/en/latest/article.were-better-than-10th-says-frustrated-ricciardo-as-he-vows-to-make-it-happen.5BsABn0Xuu0nwH4BPIaP4H.html





# **Depth From Defocus Challenges**

CoCs of Point 1 and Point 3 are the same, but they have different depth.





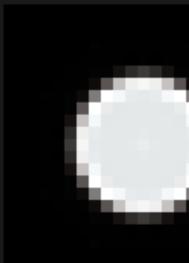


#### Defocus of general lens

#### Far out of focus

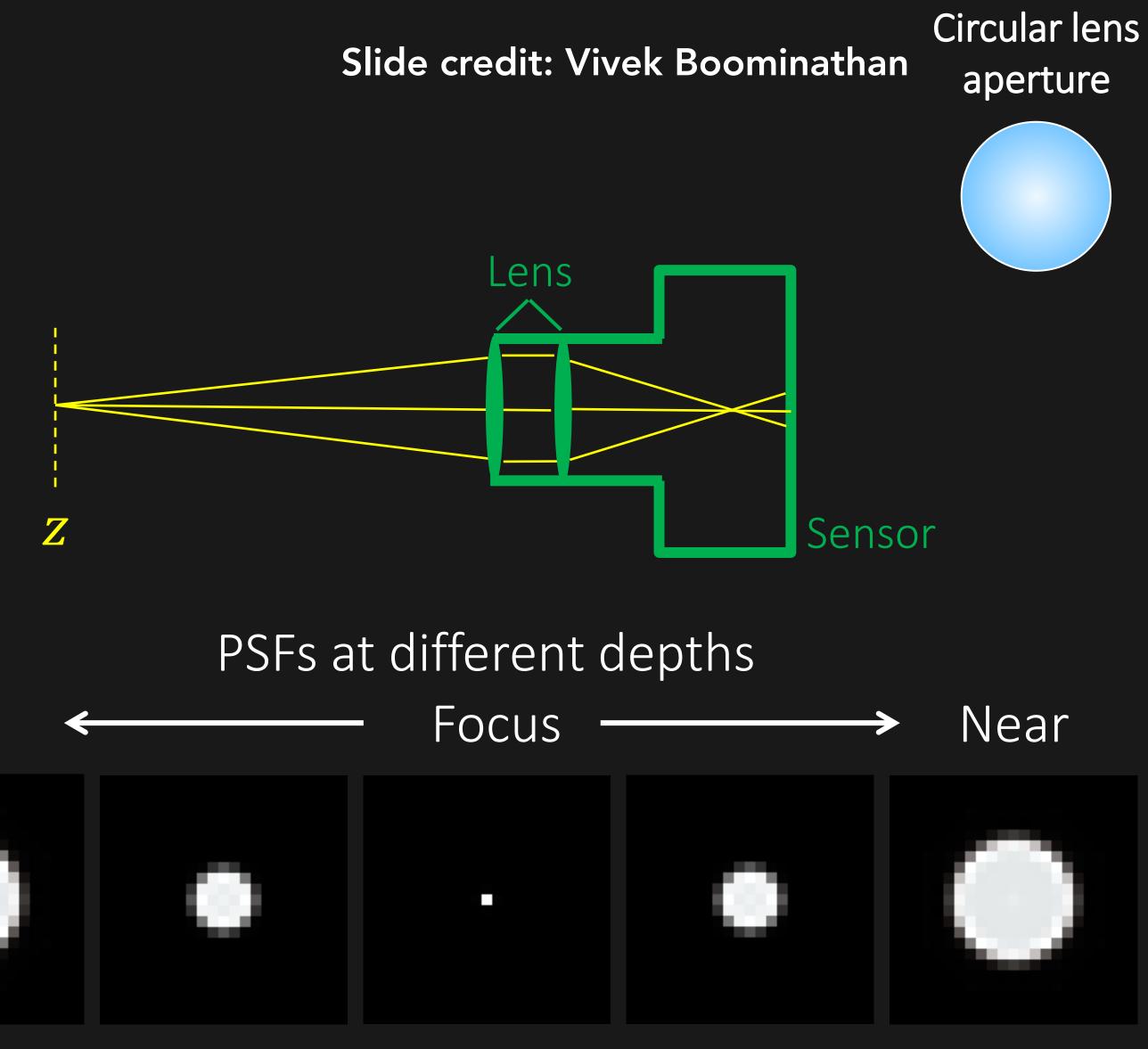
#### In focus Near out of focus

Far



× Identical PSF at both sides of the focal plane. × Impossible to tell the depth based on the blur size.

trentwoodsphoto.com



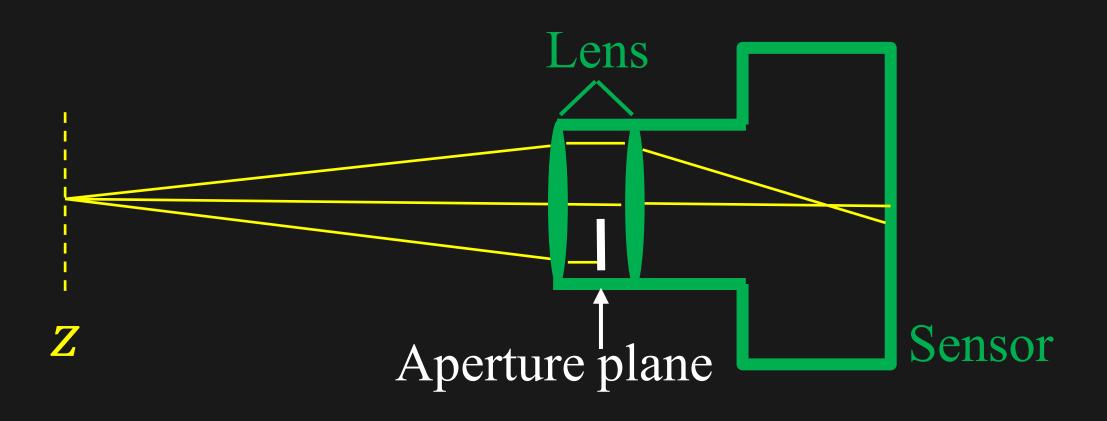


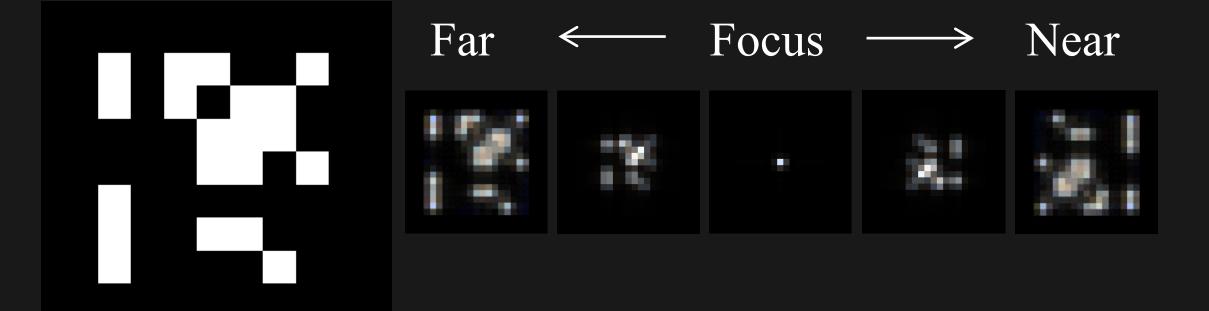




#### Independent-crafted designs

Veeraraghavan et al., 2007

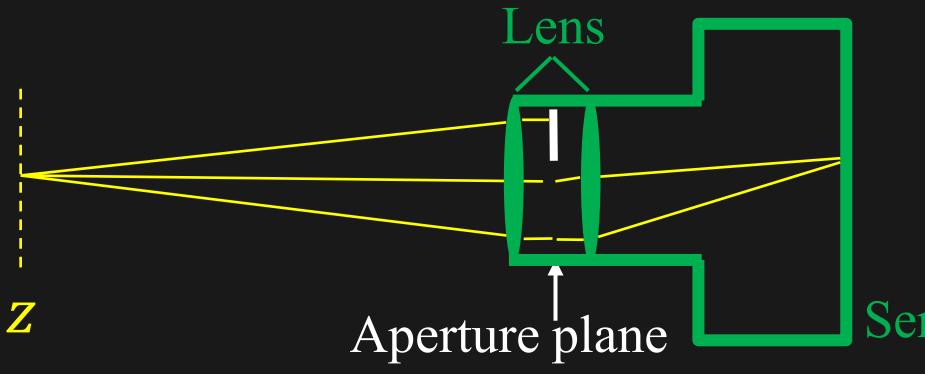


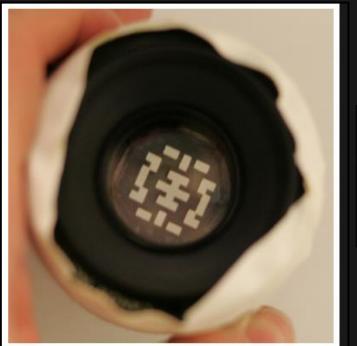


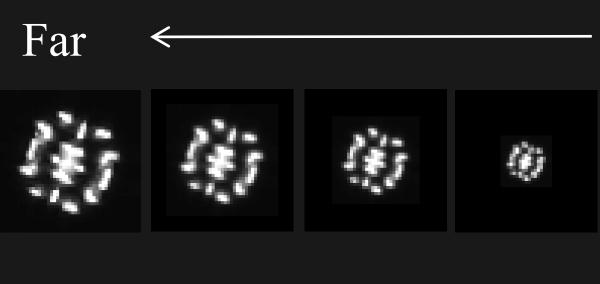
× The difference in PSFs across depth is only in scale.

Slide credit: Vivek Boominathan

#### Levin *et al.*, 2007 (previously discussed)



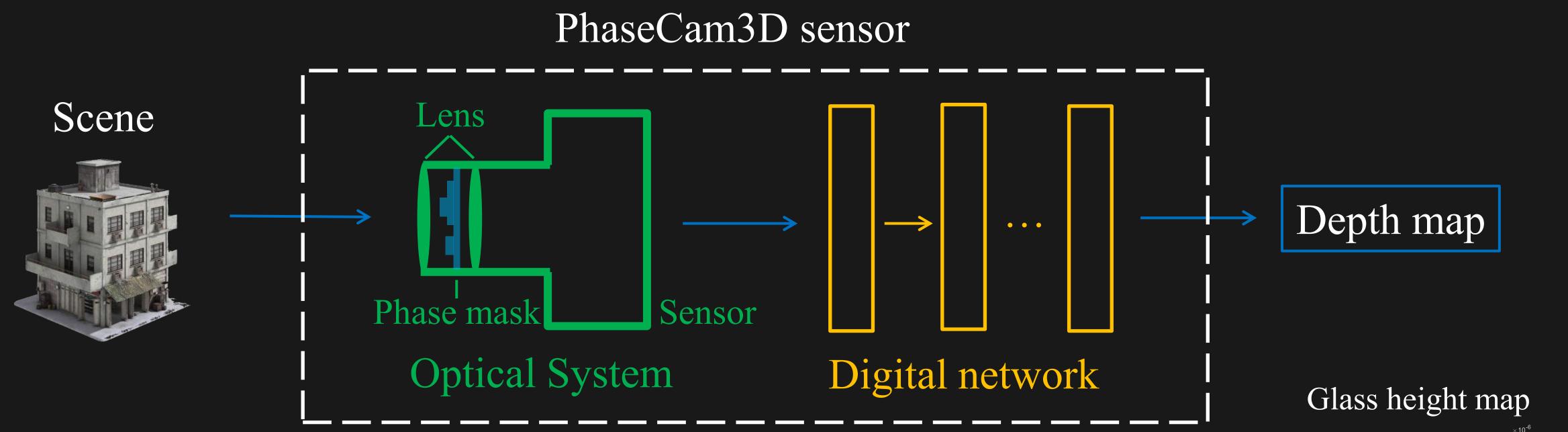


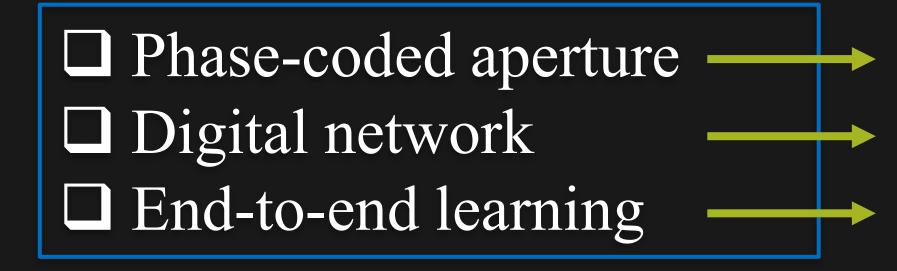






#### PhaseCam3D sensor – Three upgrades

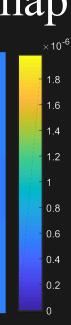




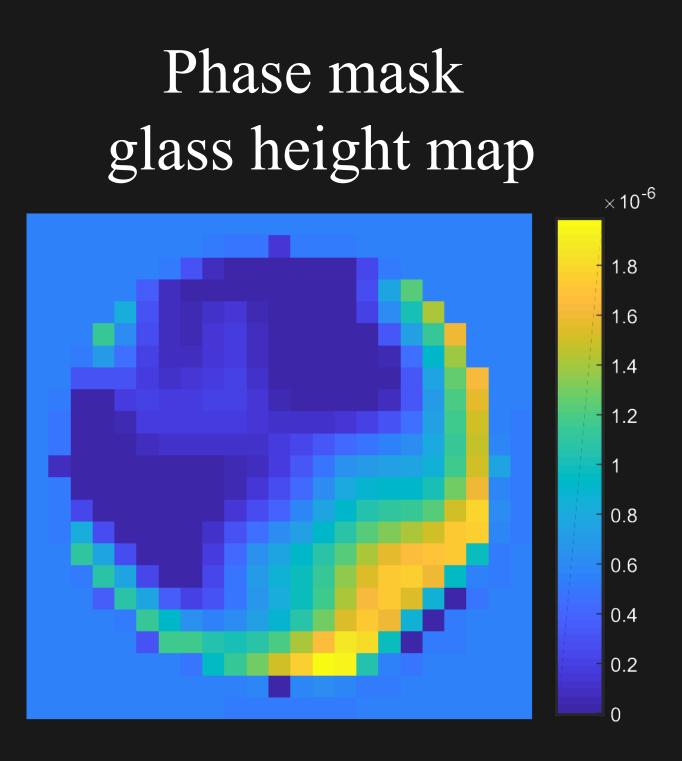
Yicheng Wu, Vivek Boominathan, et. al. "PhaseCam3D - Learning Phase Masks For Passive Single-view Depth Estimation"

Slide credit: Vivek Boominathan

More light. More control in PSFs. Better for reconstruction. → Joint learning.



#### Fabricate the learned phase mask



Yicheng Wu, Vivek Boominathan, et. al. "PhaseCam3D - Learning Phase Masks For Passive Single-view Depth Estimation"

#### Slide credit: Vivek Boominathan

#### Fabricated phase mask

