

# Digital Photography I

## optics and sensors



CSC2529

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University of Toronto

[cs.toronto.edu/~lindell/teaching/2529](https://cs.toronto.edu/~lindell/teaching/2529)

\*slides adapted from Gordon Wetzstein,  
Fredo Durand, Ioannis Gkioulekas, Marc Levoy

# Announcements

- HW 1 is due Wednesday at 11:59pm
- HW 2 is out (due next Wednesday 4/10)
  
- Instructor office hours today 4-5pm BA 7228
- TA office hours Tues 1-2pm BA 5256

Let's say we have a sensor...



digital sensor  
(CCD or  
CMOS)

... and an object we like to photograph

real-world  
object



digital sensor  
(CCD or  
CMOS)



What would an image taken like this look like?

# Bare-sensor imaging

real-world  
object



digital sensor  
(CCD or  
CMOS)

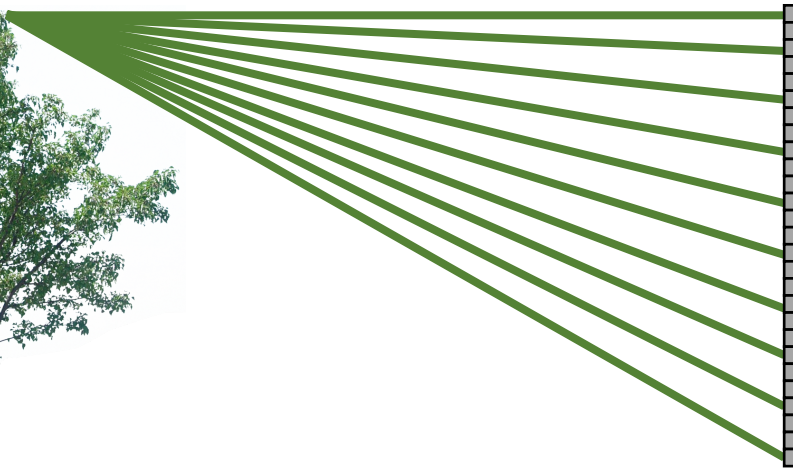


# Bare-sensor imaging

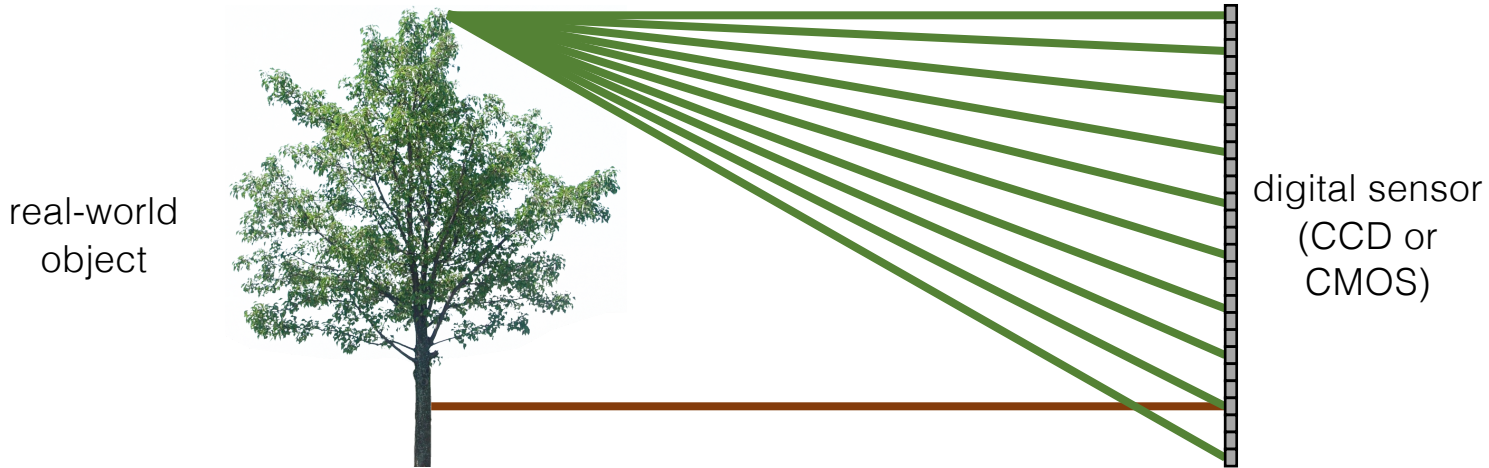
real-world  
object



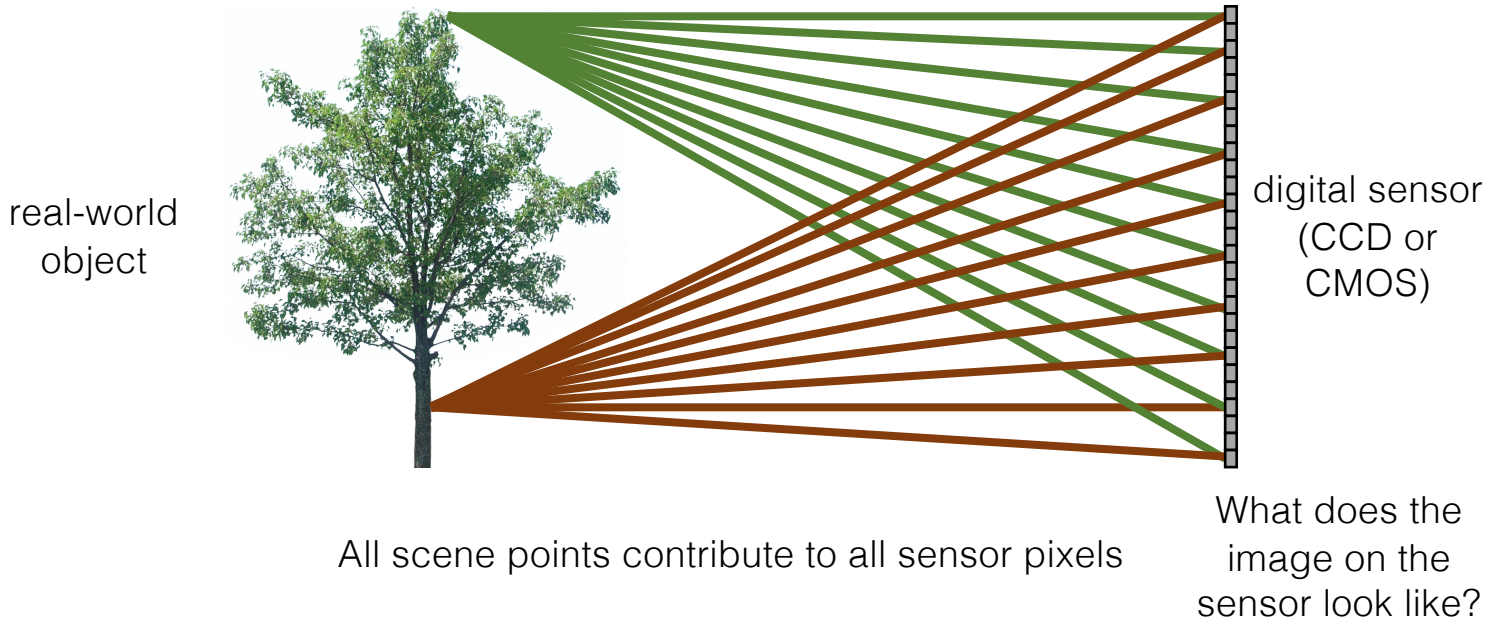
digital sensor  
(CCD or  
CMOS)



# Bare-sensor imaging



# Bare-sensor imaging





# Bare-sensor imaging



All scene points contribute to all sensor pixels

# What can we do to make our image look better?

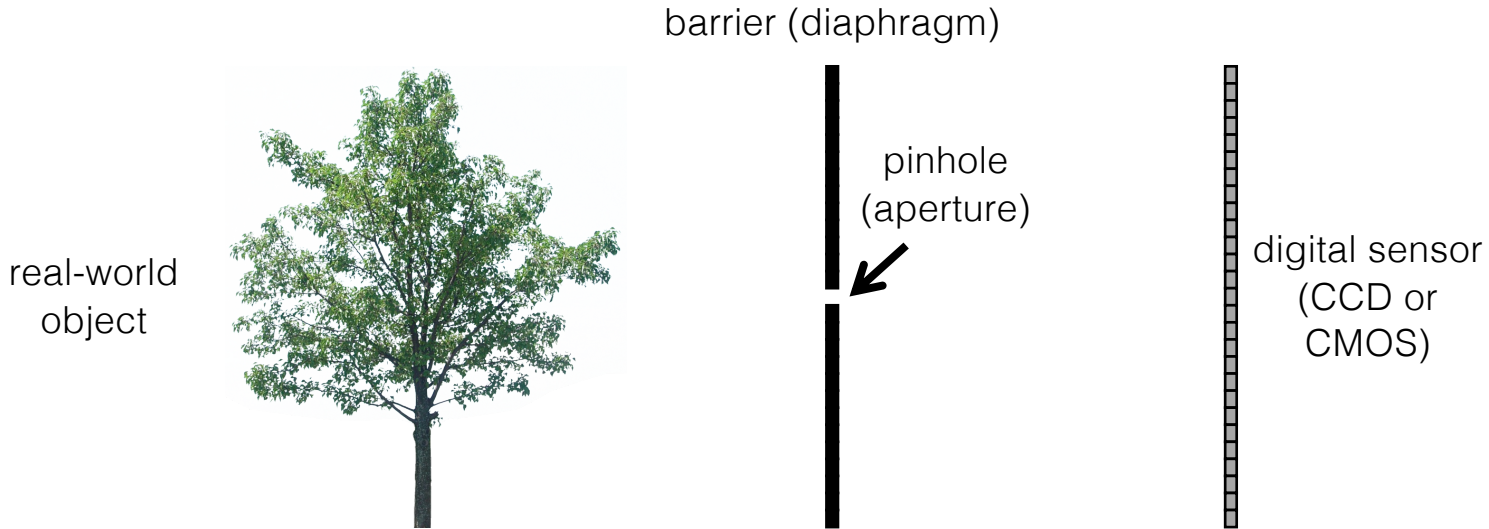
real-world  
object



digital sensor  
(CCD or  
CMOS)

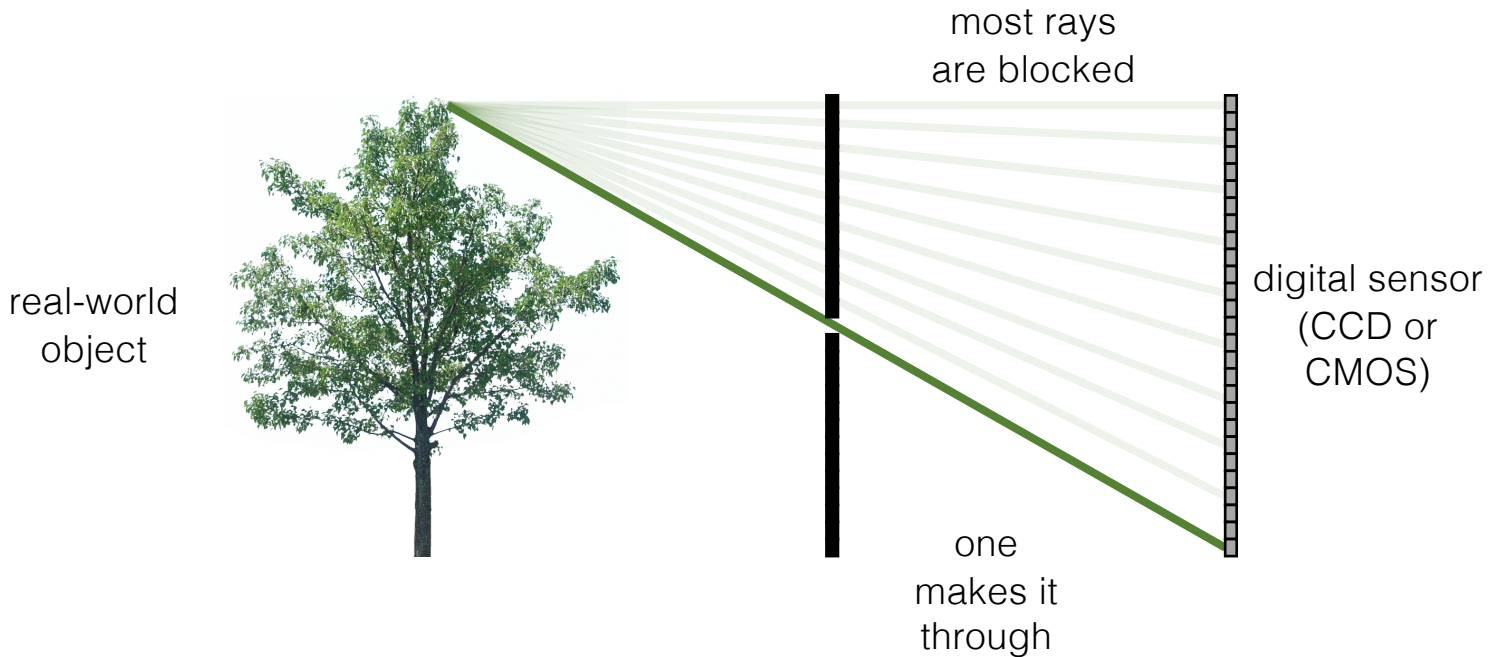


# Let's add something to this scene

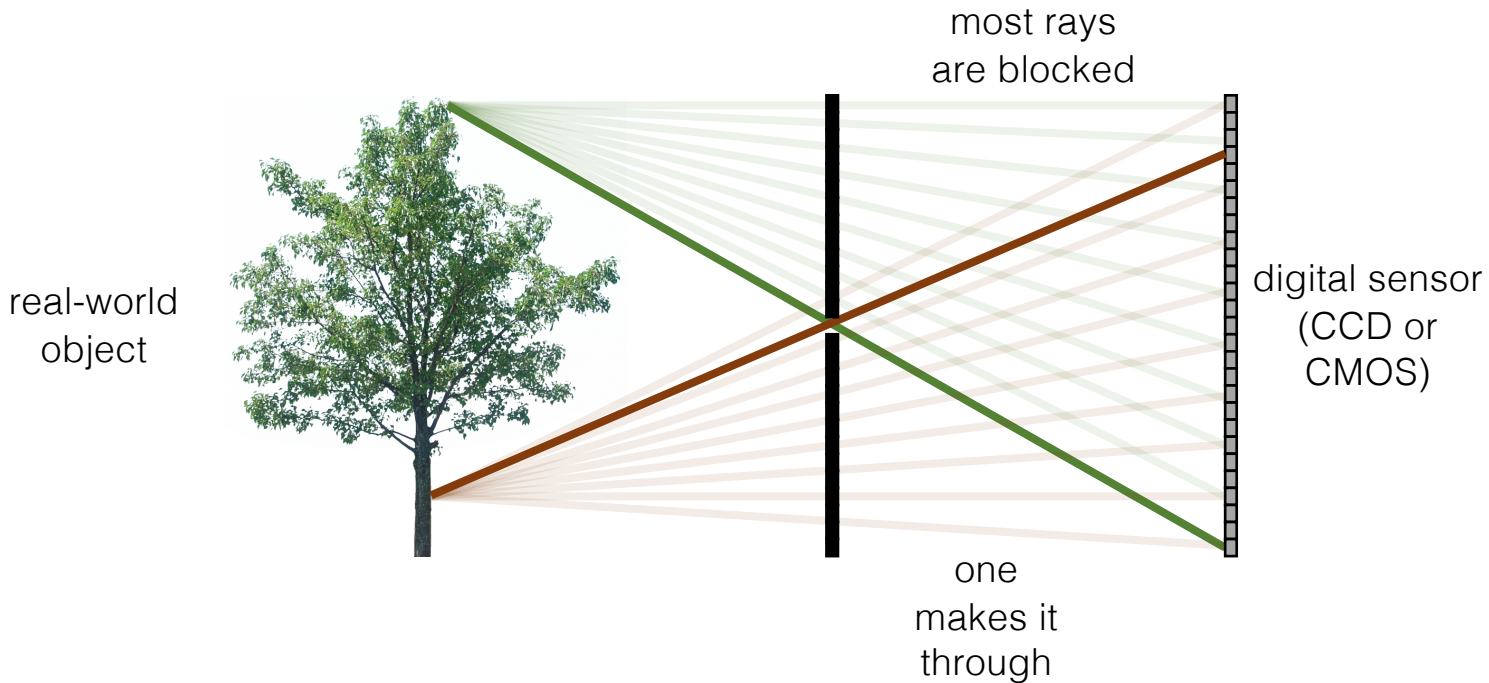


What would an image taken like this look like?

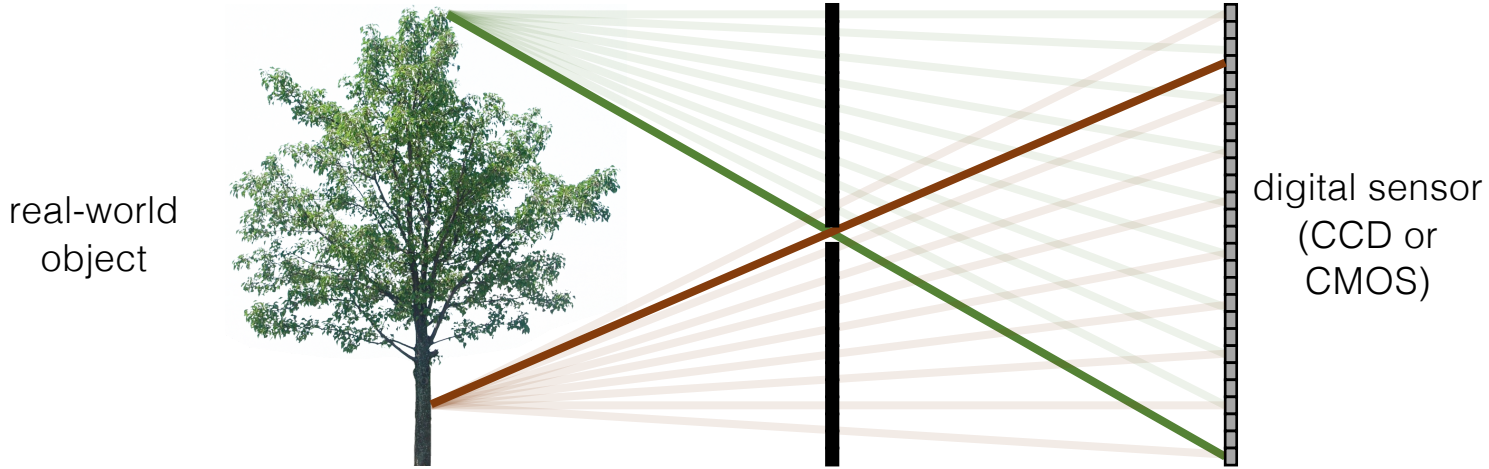
# Pinhole imaging



# Pinhole imaging



# Pinhole imaging

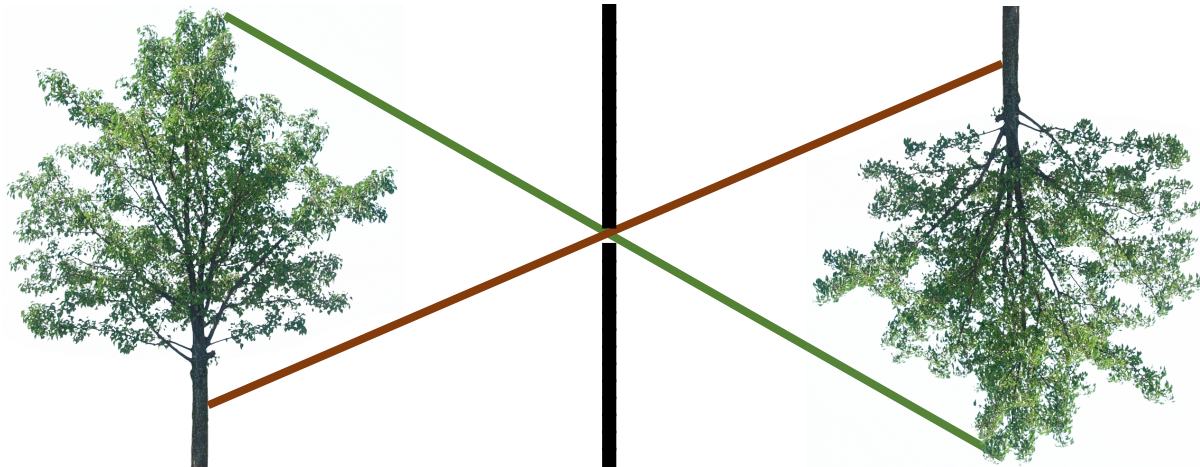


Each scene point contributes to only one sensor pixel

What does the image on the sensor look like?

# Pinhole imaging

real-world  
object



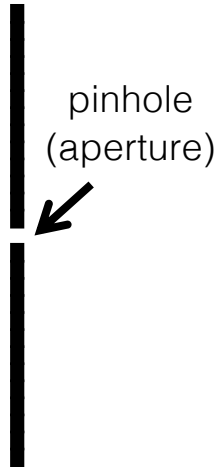
copy of real-world object  
(inverted and scaled)

# Pinhole camera terms

real-world  
object



barrier (diaphragm)



digital sensor  
(CCD or  
CMOS)





# Pinhole camera terms

real-world  
object



barrier (diaphragm)



pinhole  
(aperture)



camera center  
(center of  
projection)

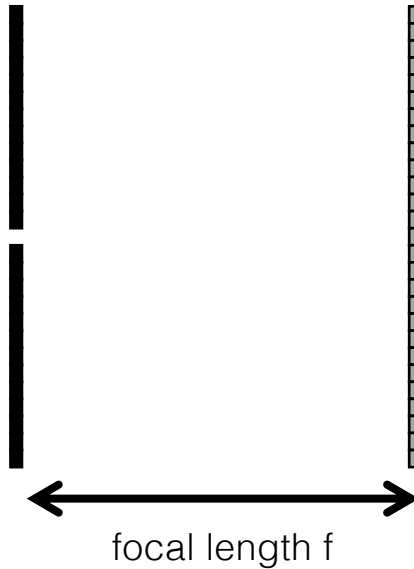
image plane



digital sensor  
(CCD or  
CMOS)

# Focal length

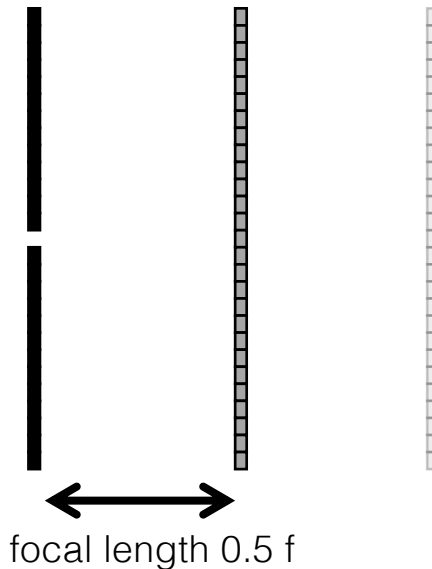
real-world  
object



# Focal length

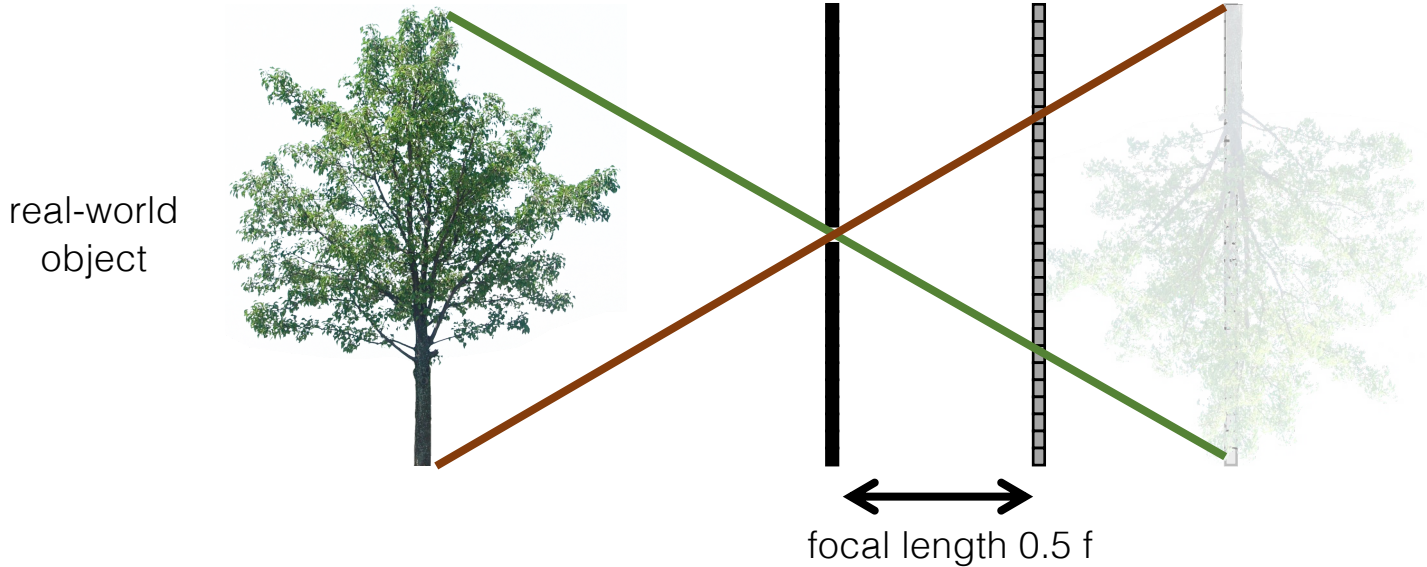
What happens as we change the focal length?

real-world  
object



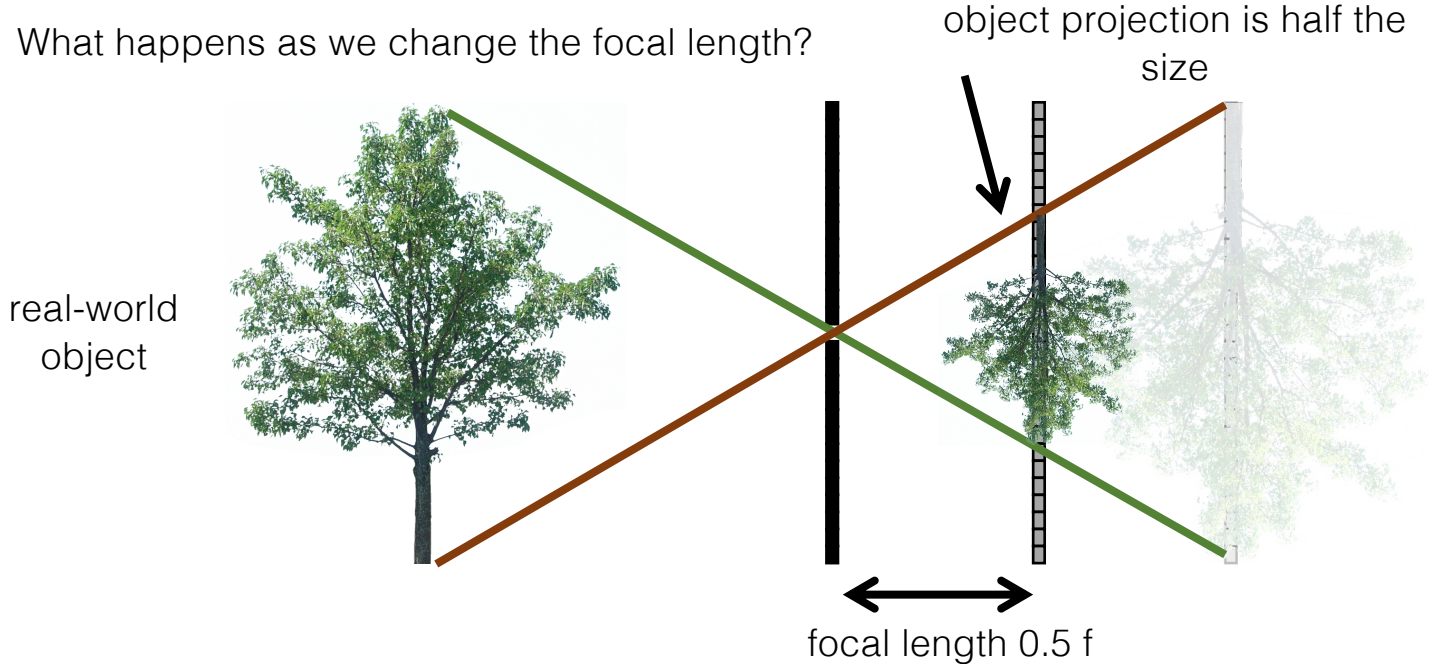
# Focal length

What happens as we change the focal length?



# Focal length

What happens as we change the focal length?



# Pinhole size

real-world  
object



pinhole  
diameter



Ideal pinhole has infinitesimally small size

- In practice that is impossible.

# Pinhole size

What happens as we change the pinhole diameter?

real-world  
object



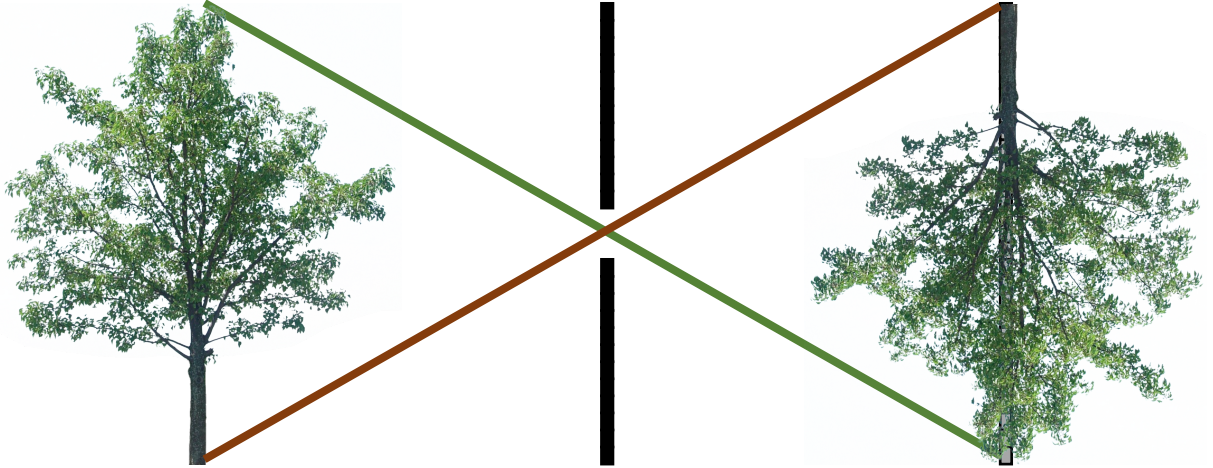
pinhole  
diameter



# Pinhole size

What happens as we change the pinhole diameter?

real-world  
object

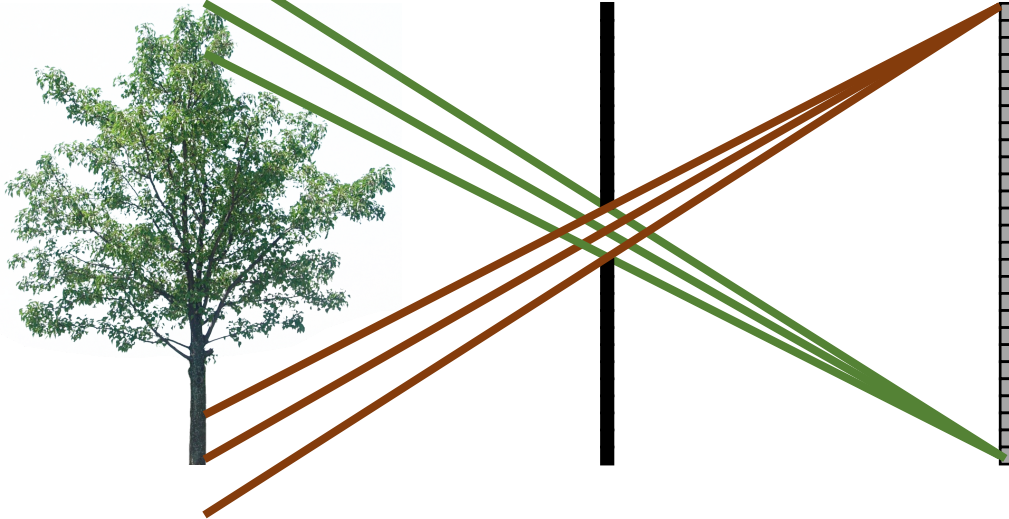




# Pinhole size

What happens as we change the pinhole diameter?

real-world  
object

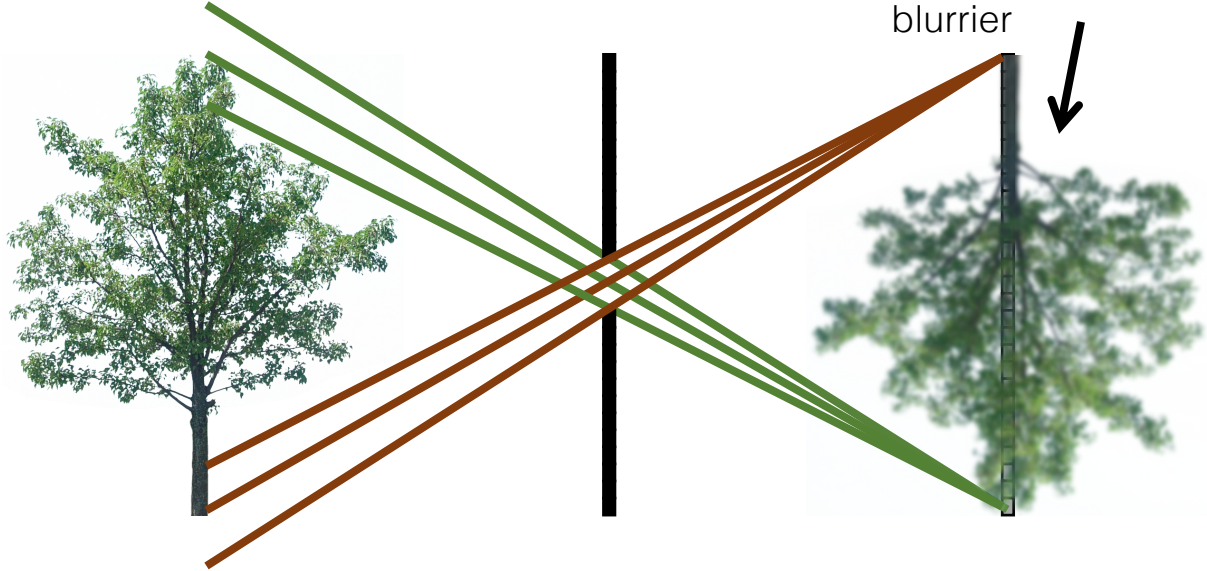


# Pinhole size

What happens as we change the pinhole diameter?

object projection becomes blurrier

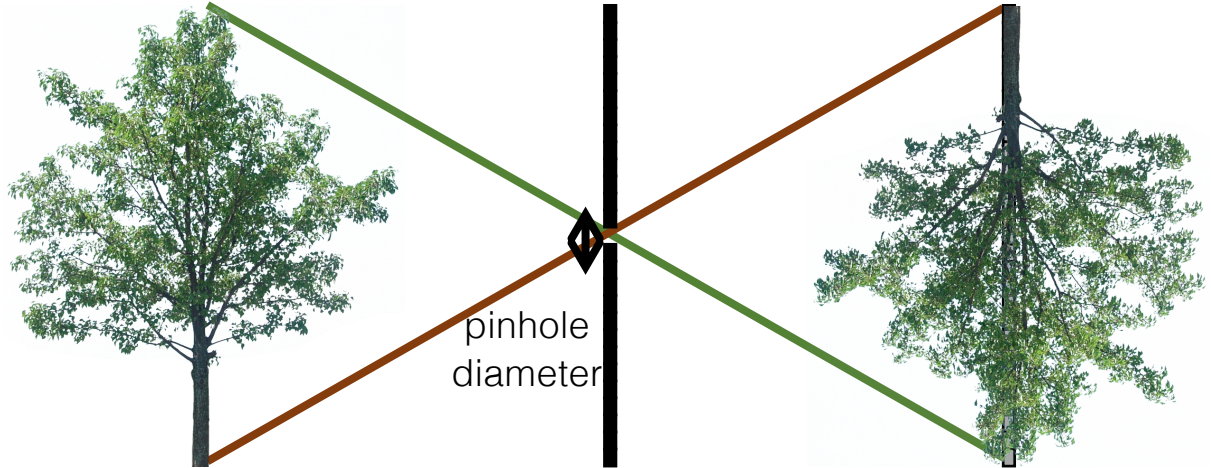
real-world object



# Pinhole size

What happens as we change the pinhole diameter?

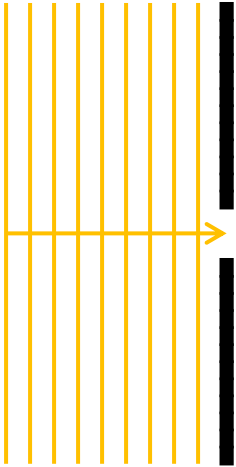
real-world  
object



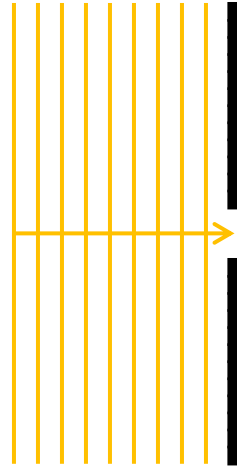
Will the image keep getting sharper the smaller we make the pinhole?

# Diffraction limit

A consequence of the wave nature of light



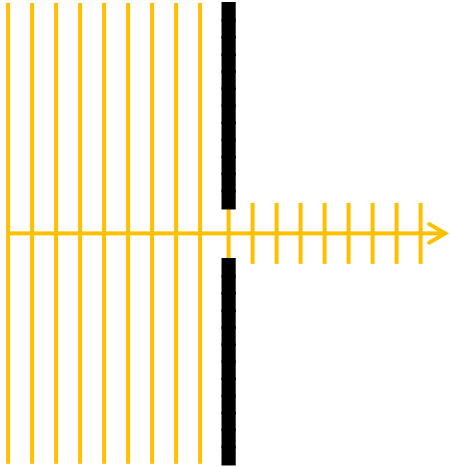
What do geometric optics predict will happen?



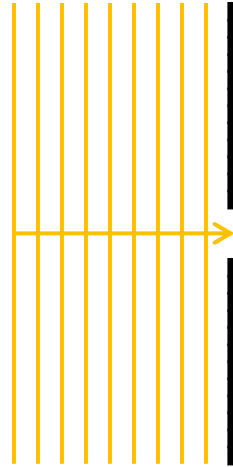
What do wave optics predict will happen?

# Diffraction limit

A consequence of the wave nature of light



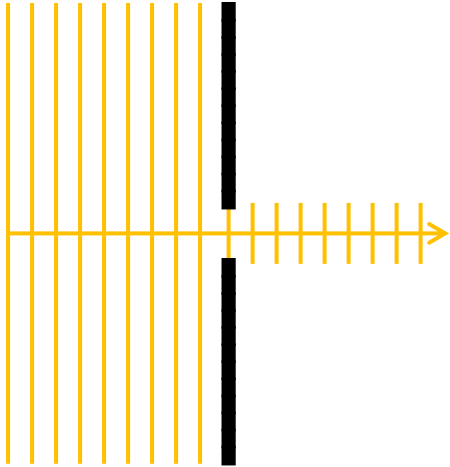
What do geometric optics  
predict will happen?



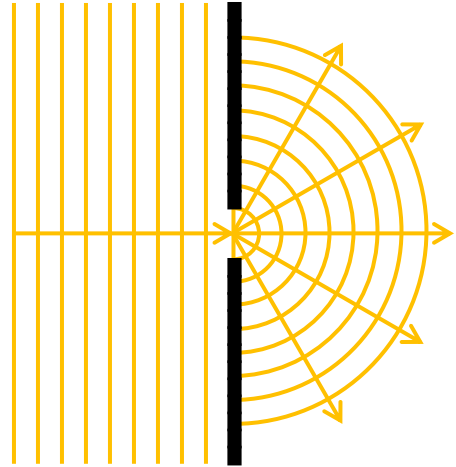
What do wave optics  
predict will happen?

# Diffraction limit

A consequence of the wave nature of light



What do geometric optics predict will happen?

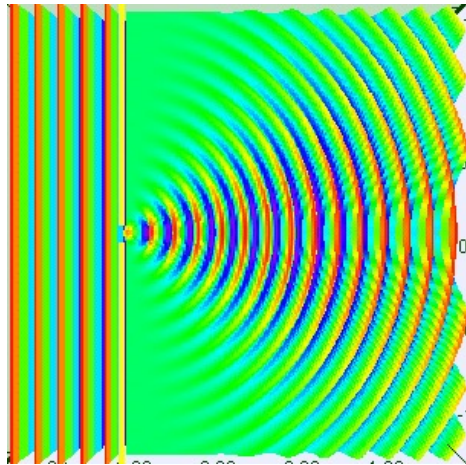


What do wave optics predict will happen?

# Diffraction limit

Diffraction pattern = Fourier transform of the pinhole.

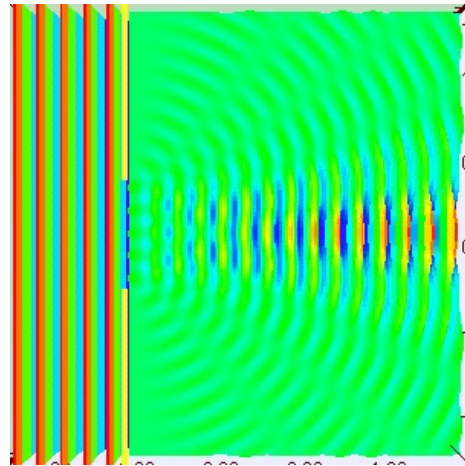
- Smaller pinhole means bigger Fourier spectrum.
- Smaller pinhole means more diffraction.



small pinhole



wide  
diffraction  
pattern



large pinhole



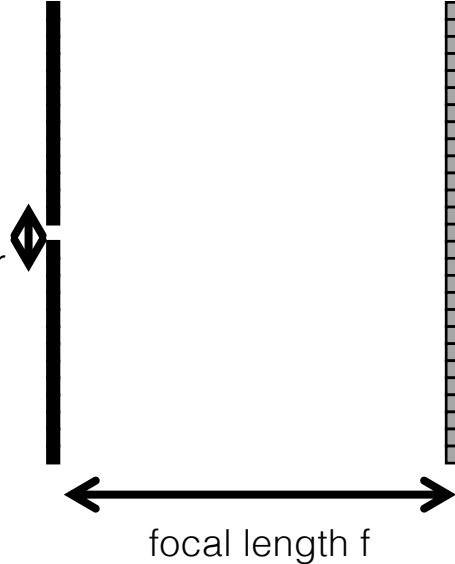
narrow  
diffraction  
pattern

# What about light efficiency?

real-world  
object



pinhole  
diameter



- What is the effect of doubling the pinhole diameter?
- What is the effect of doubling the focal length?

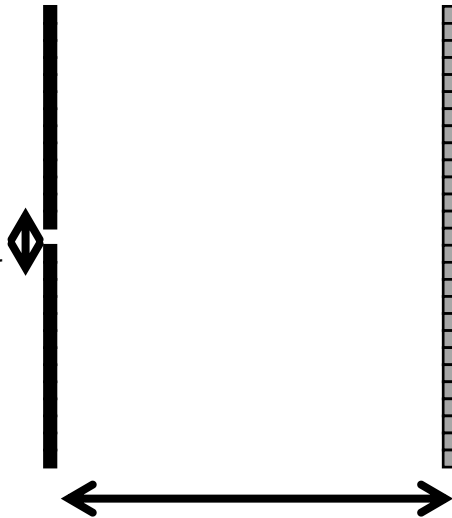


# What about light efficiency?

real-world  
object



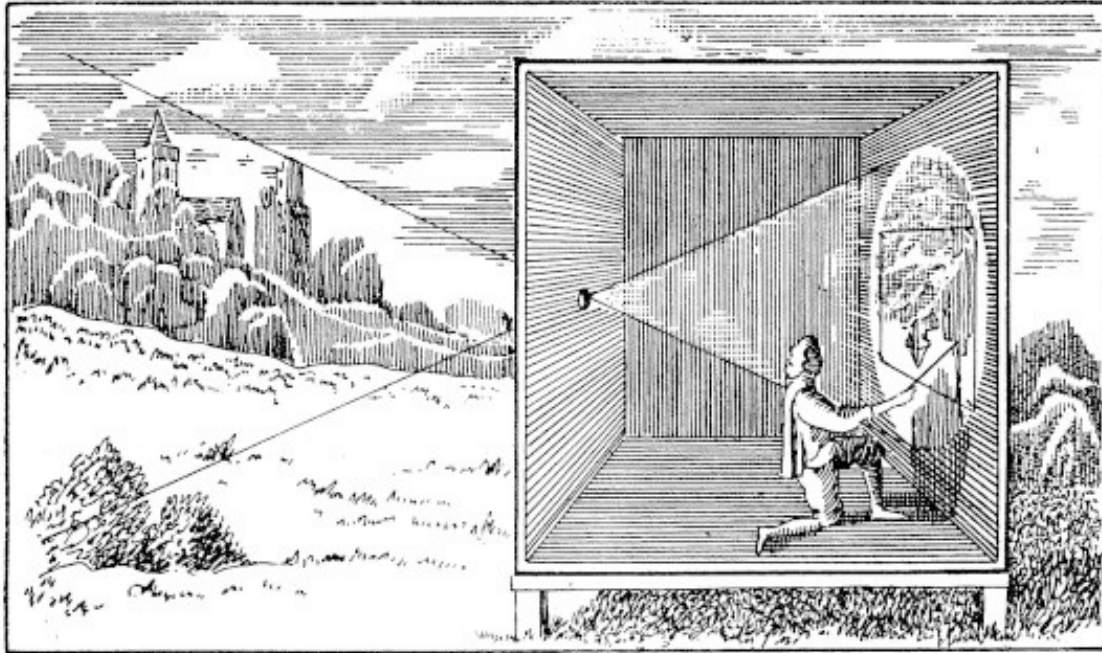
pinhole  
diameter



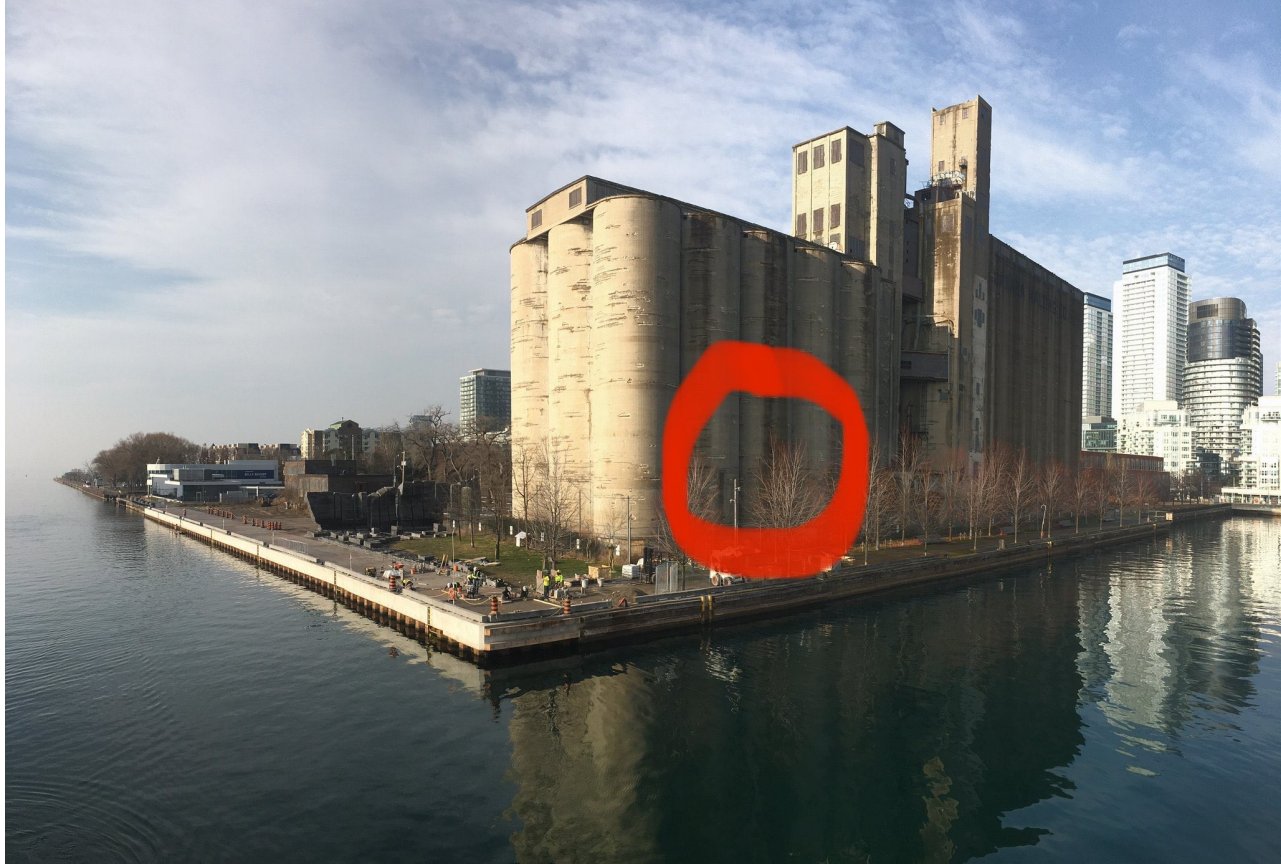
focal length  $f$

- 2x pinhole diameter  $\rightarrow$  4x light
- 2x focal length  $\rightarrow$   $\frac{1}{4}$ x light

# Pinhole Camera / Camera Obscura



Mo-Ti (Chinese Philosopher) 470-390 BC

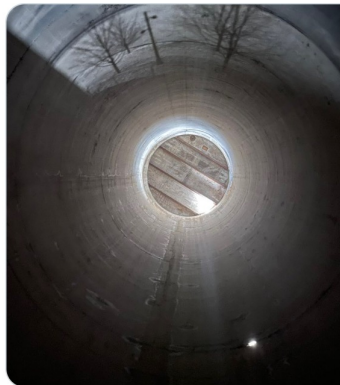




**Bryan Bowen**  
@bryanmbowen



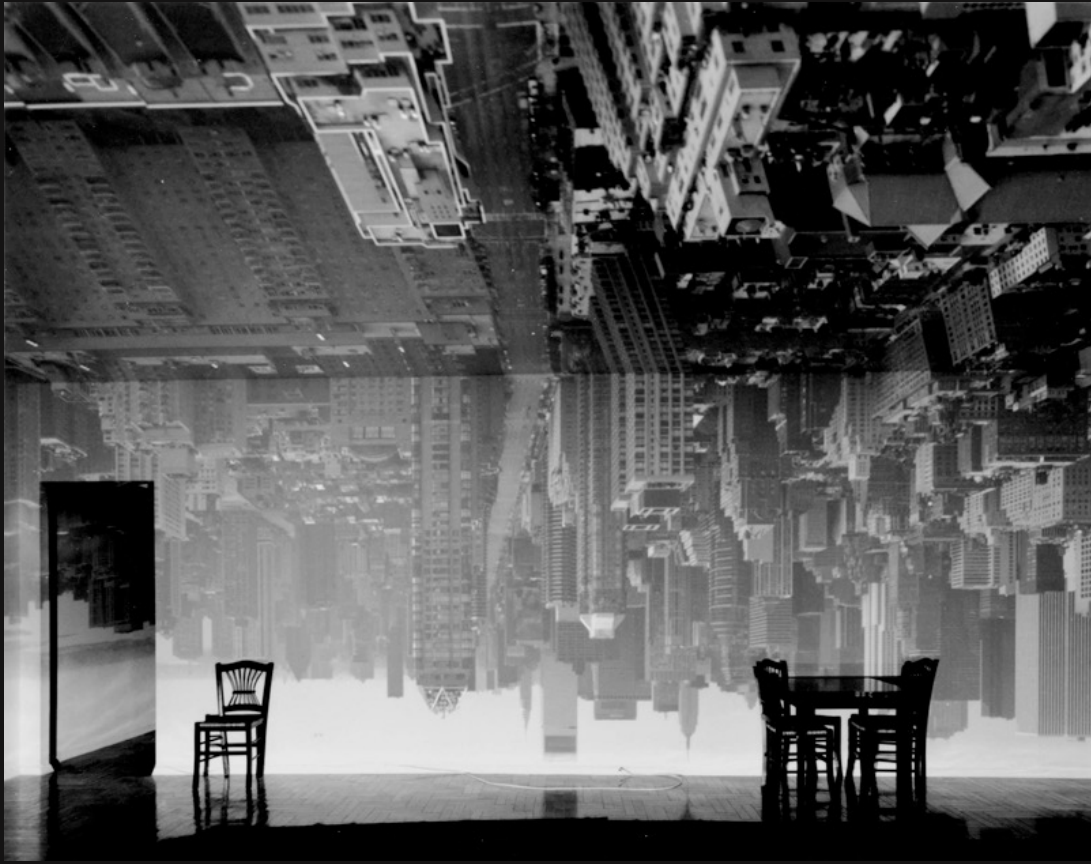
Fun discovery - a small crack in the eastern facade of the Canada Malting Co silos has created a perfect pinhole camera. The result: real time projection of Toronto's waterfront on the silo's interior curved surfaces. An unplugged projection show!



9:37 AM · Jan 27, 2022 · Twitter for iPhone

656 Retweets 70 Quote Tweets 2,836 Likes



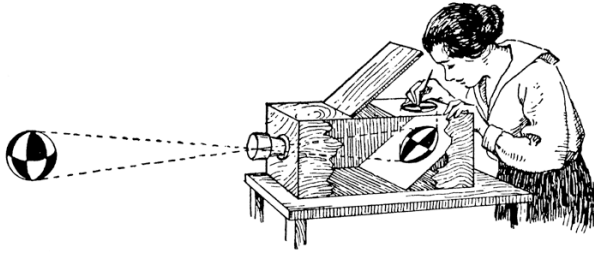






Abelardo Morell

# Pinhole Camera / Camera Obscura



J. Vermeer "The Milkmaid", 1658





同サイズの《牛乳を注ぐ女》が投影される額縁の前に立ち

Credit: ©Toppan Printing Co., Ltd.

Original photo data (Het melkmeisje [The Milkmaid] by Johannes Vermeer) :

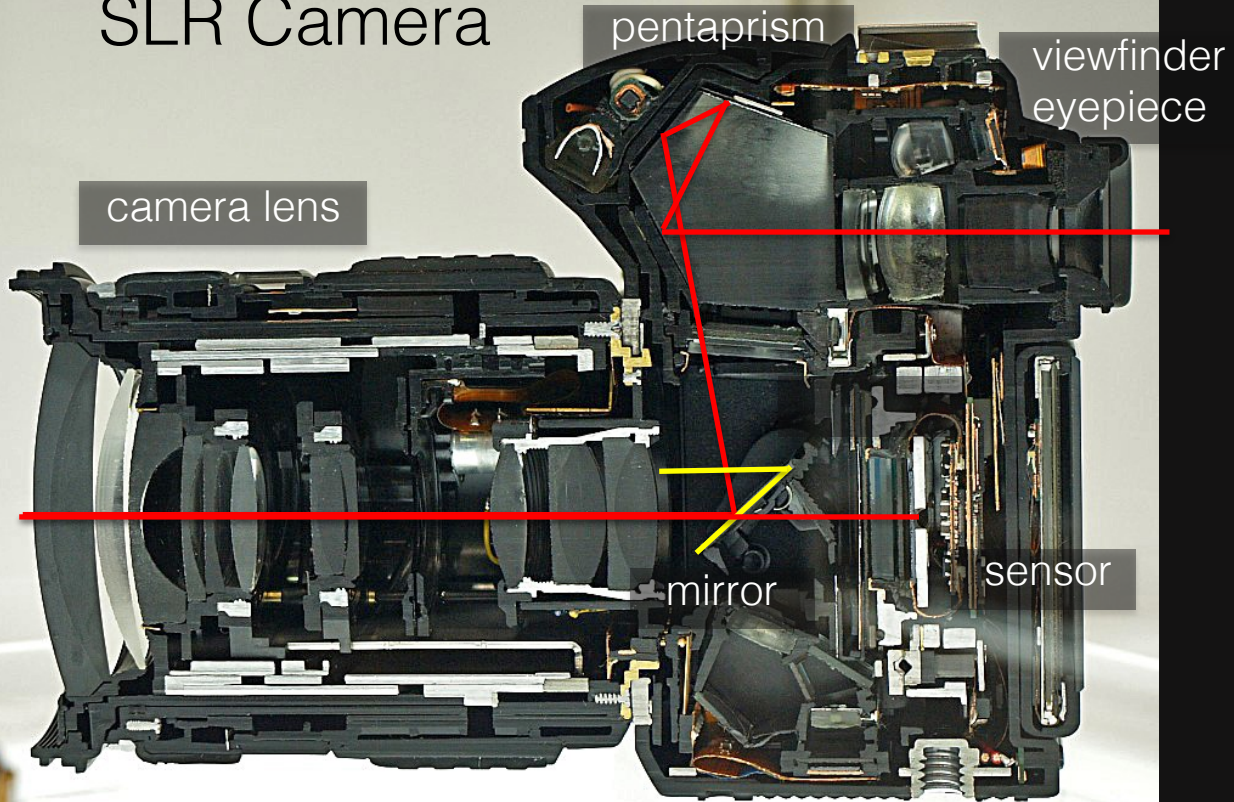
©Rijksmuseum Amsterdam. Purchased with the support of the Vereniging Rembrandt

# Digital Photography - Overview

- optics
- aperture
- depth of field
- field of view
- exposure
- noise
- color filter arrays
- image processing pipeline



# SLR Camera



# Camera Optics

Niepce "View from the Window at Le Gras", 1826



1826  
8h exp

# Daguerrotype



- invented in 1836 by Louis Daguerre
- lenses focus light, better chemicals!

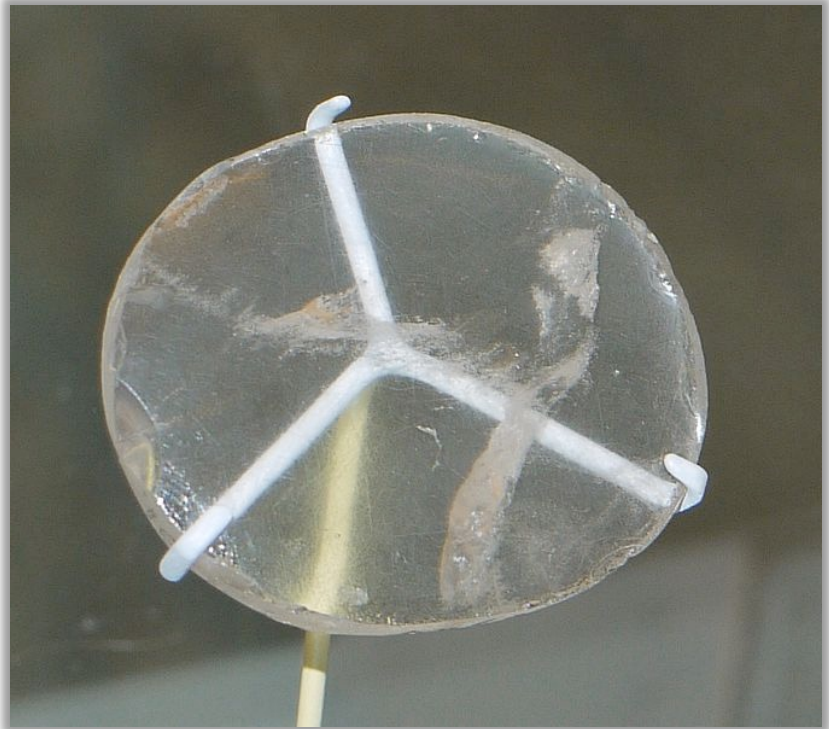
Daguerre "Boulevard du Temple", 1838



exposure  
10-12 mins

# Lenses

- focus light
- magnify objects

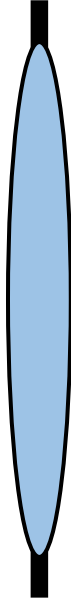


Nimrud lens - 2700 years old



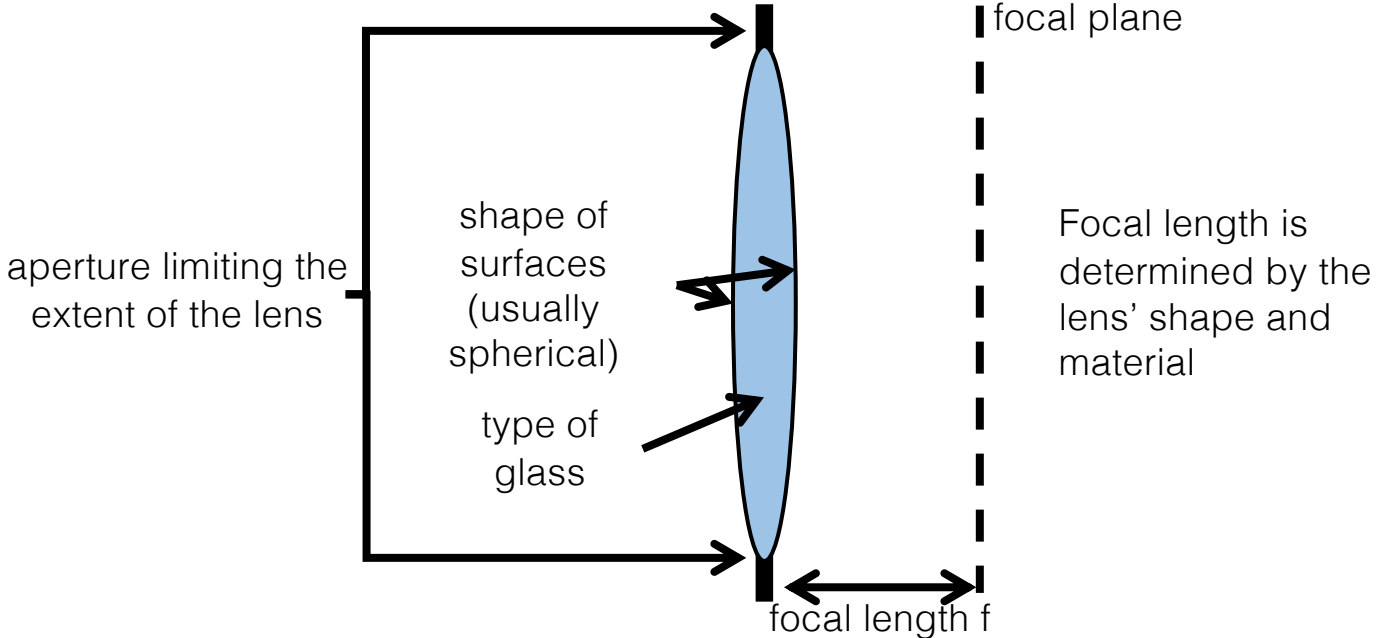
# What is a lens?

A piece of glass manufactured to have a specific shape

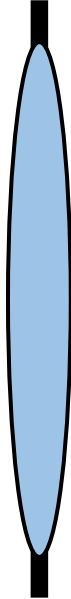


# What is a lens?

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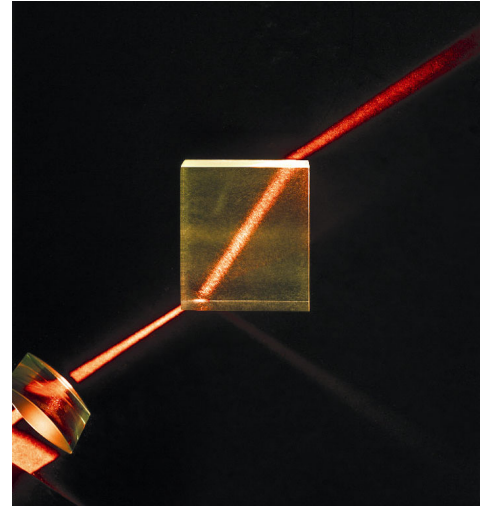
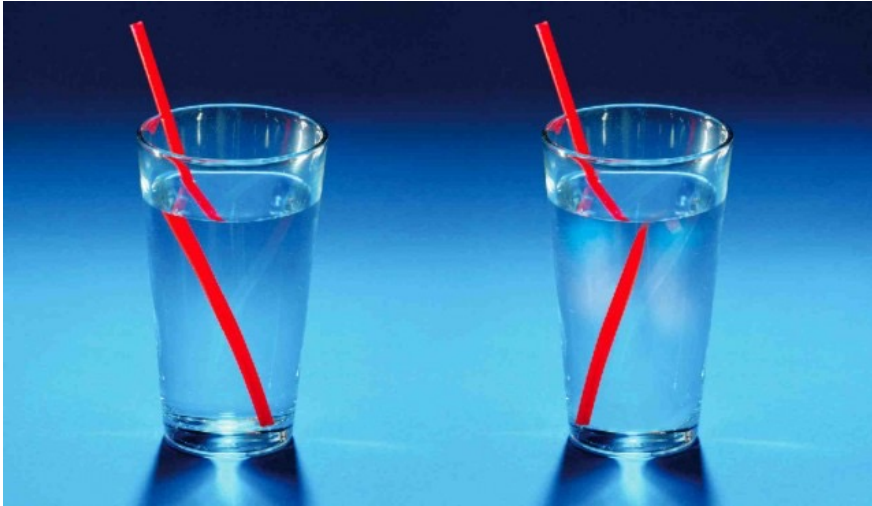


# How does a lens work?



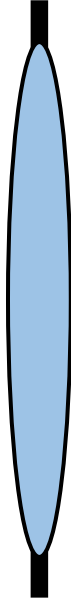
# Refraction

Refraction is the bending of rays of light when they move from one material to another



# How does a lens work?

Lenses are designed so that their refraction makes light rays bend in a very specific way.



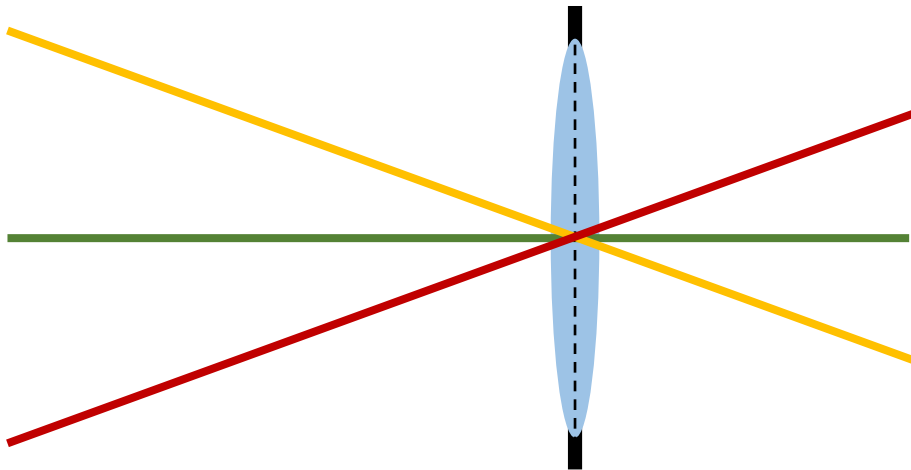
# Thin lens model

Simplification of geometric optics for well-designed lenses.



# Thin lens model

Simplification of geometric optics for well-designed lenses.

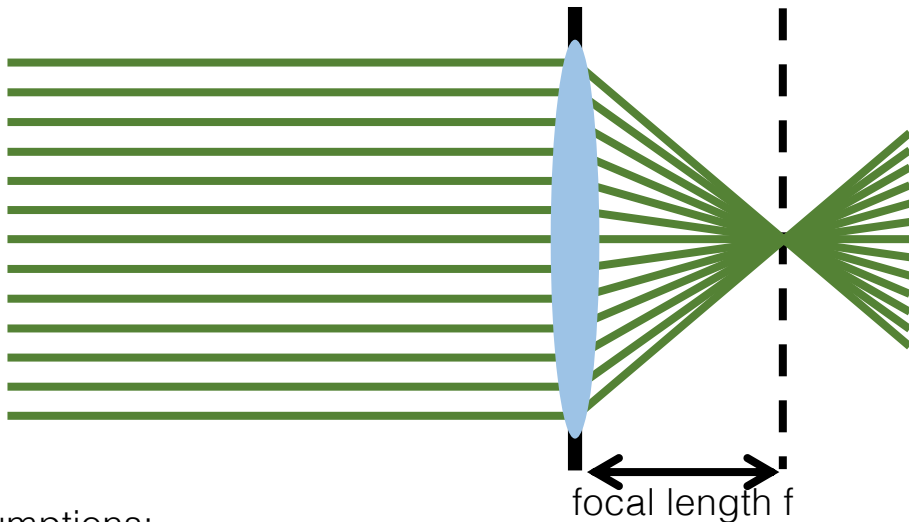


Two assumptions:

1. Rays passing through lens center are unaffected.

# Thin lens model

Simplification of geometric optics for well-designed lenses.



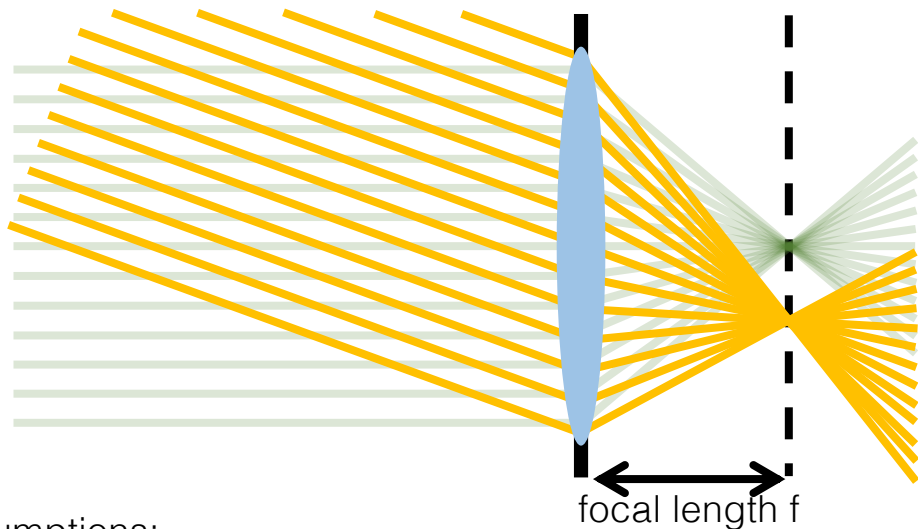
Two assumptions:

1. Rays passing through lens center are unaffected.
2. Parallel rays converge to a single point located on focal plane.



# Thin lens model

Simplification of geometric optics for well-designed lenses.

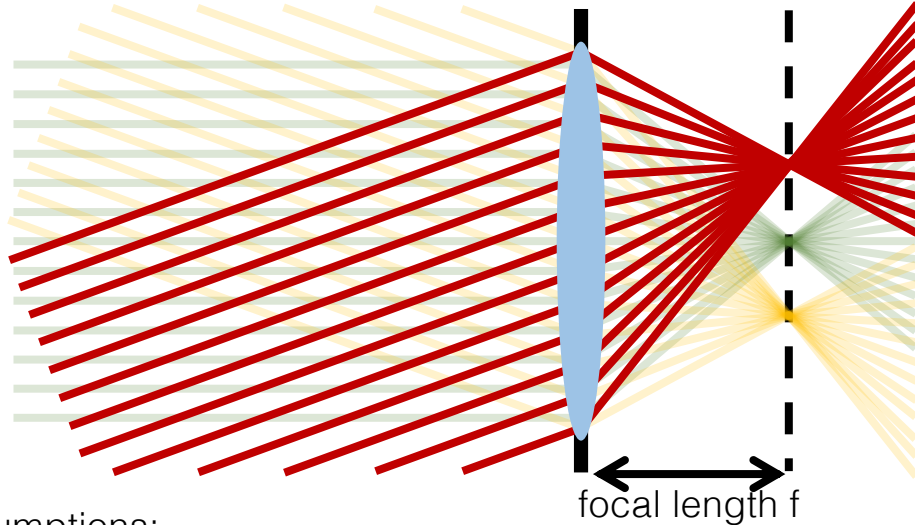


Two assumptions:

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# Thin lens model

Simplification of geometric optics for well-designed lenses.



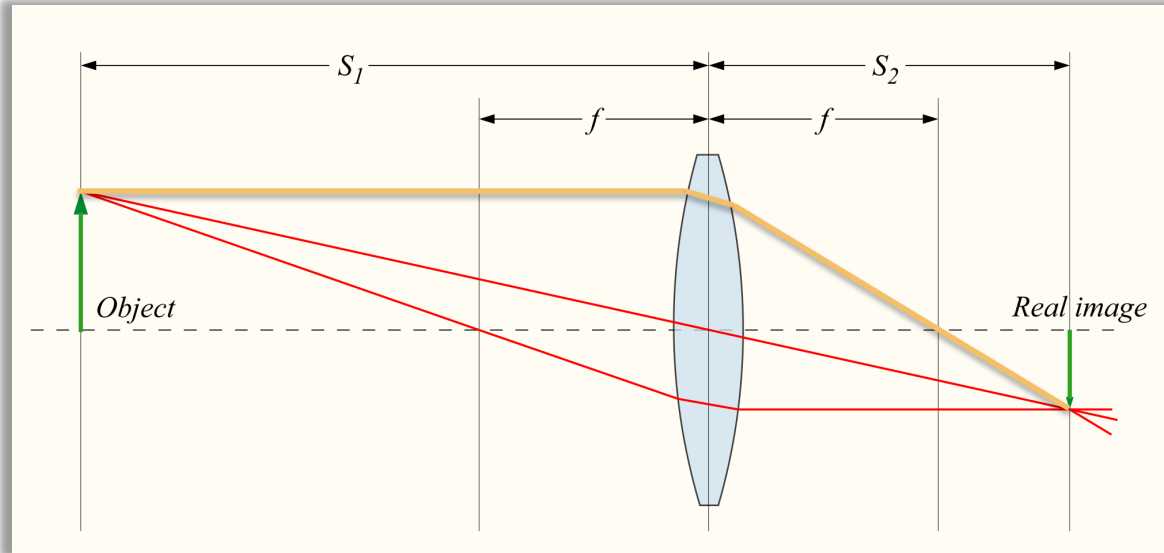
Two assumptions:

1. Rays passing through lens center are unaffected.
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# Thin Lens Model

## Ray tracing example

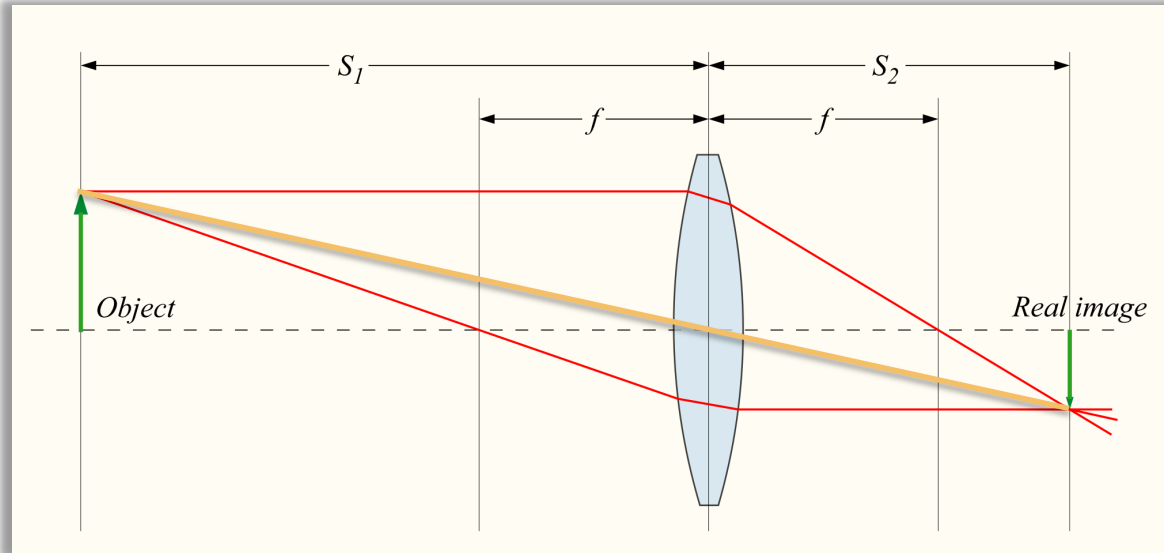
- Parallel rays map to the focal plane



# Thin Lens Model

## Ray tracing example

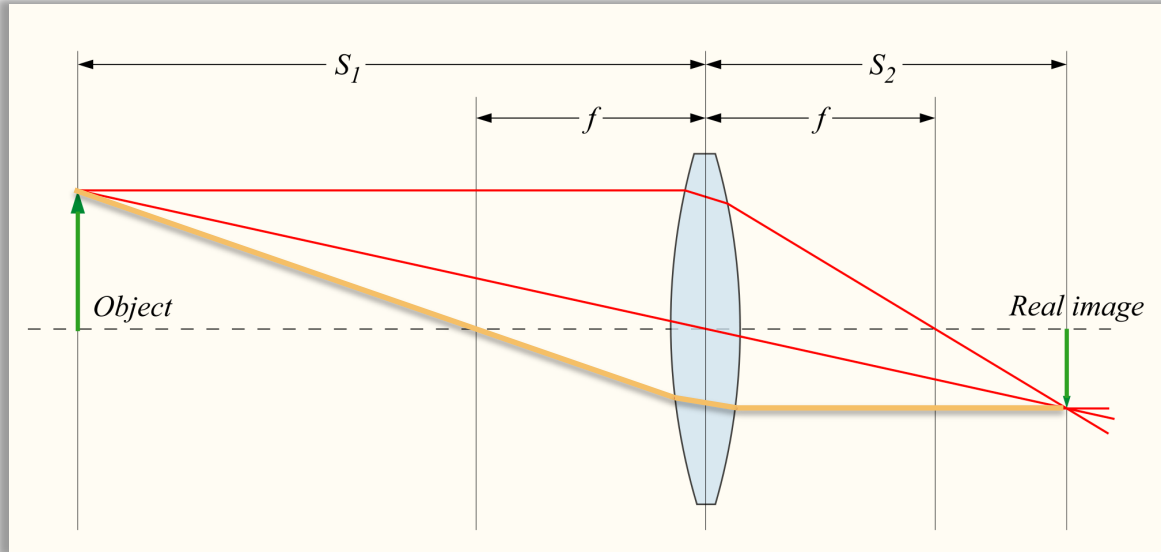
- Parallel rays map to the focal plane
- The chief ray passes straight through the center



# Thin Lens Model

## Ray tracing example

- Parallel rays map to the focal plane
- The chief ray passes straight through the center
- The ray that passes through the near focal plane becomes parallel

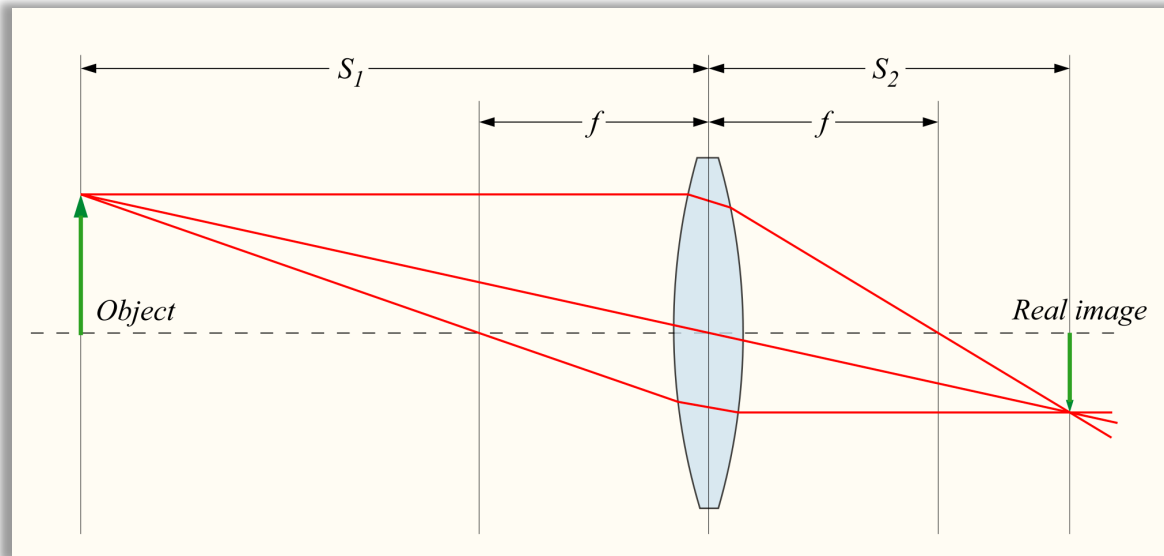


# Thin Lens Model

Thin lens  
formula

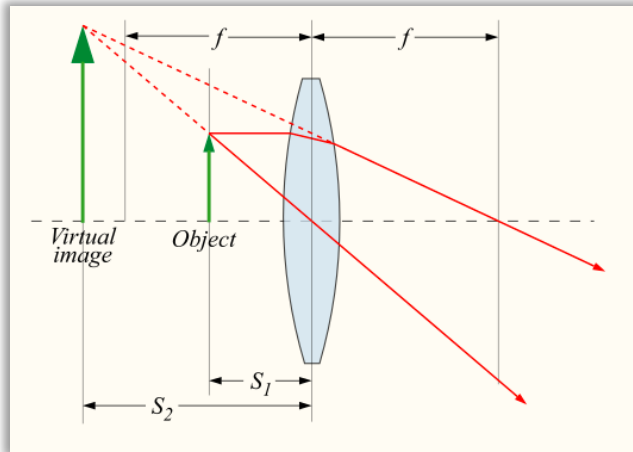
$$\frac{1}{f} = \frac{1}{S_1} + \frac{1}{S_2}$$

magnification:  $M = -\frac{S_2}{S_1} = \frac{f}{f - S_1}$



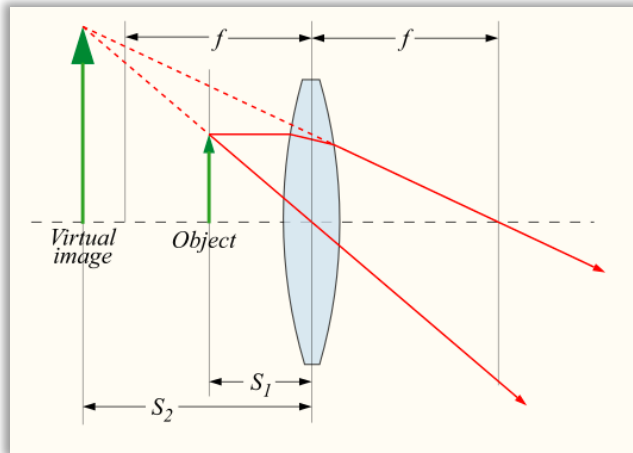
# Lenses

$S_1 < f$ : magnifying glass

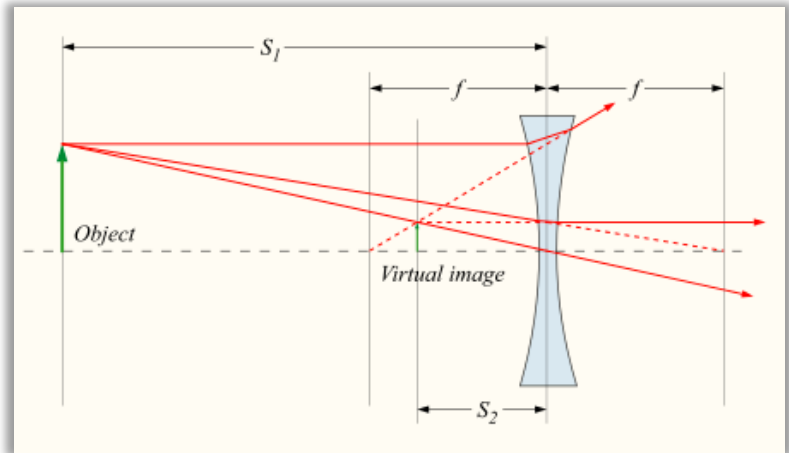


# Lenses

$S_1 < f$ : magnifying glass



minification

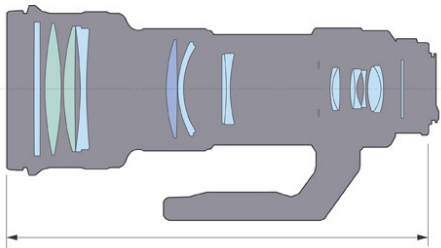
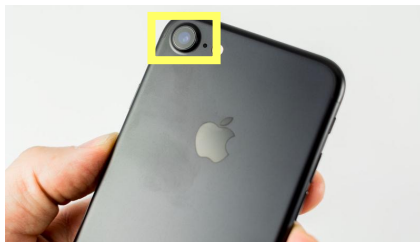




Yes, but...

# Thin lenses are a fiction

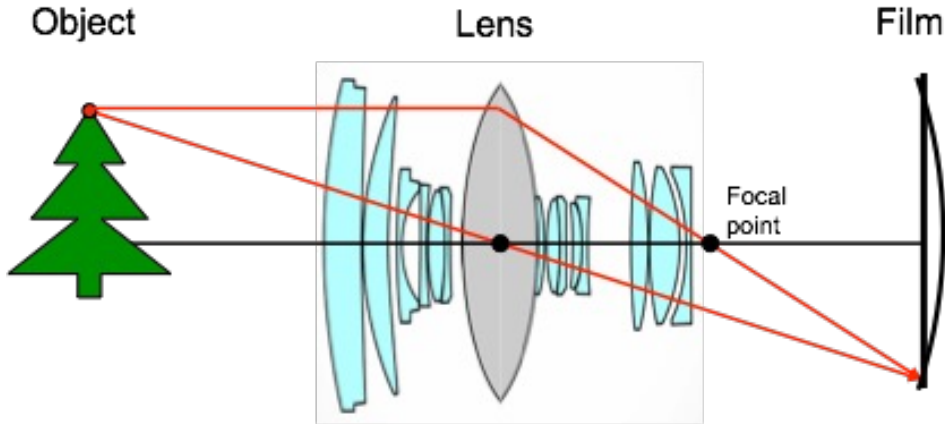
The thin lens model assumes that the lens has no thickness, but this is rarely true...



To make real lenses behave like ideal thin lenses, we have to use combinations of multiple lens elements (compound lenses).

# Thin lenses are a fiction

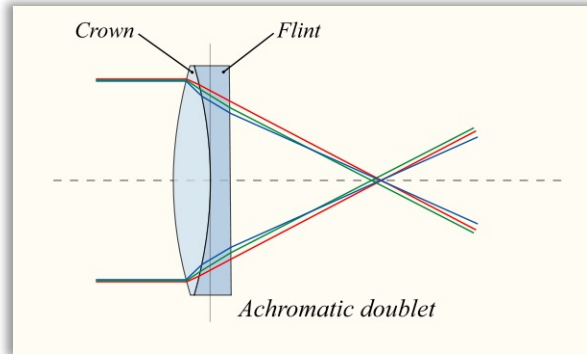
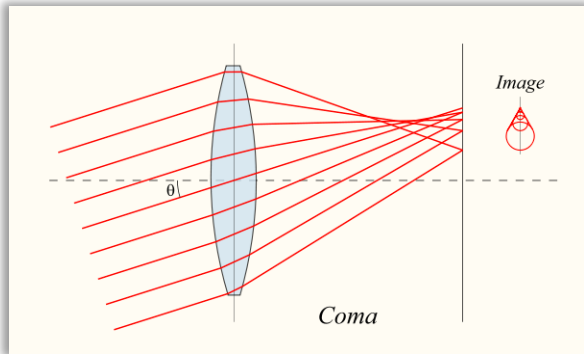
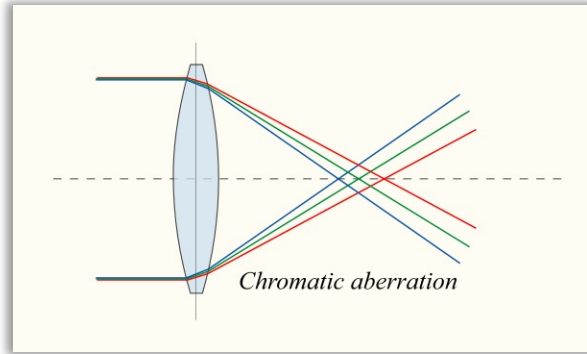
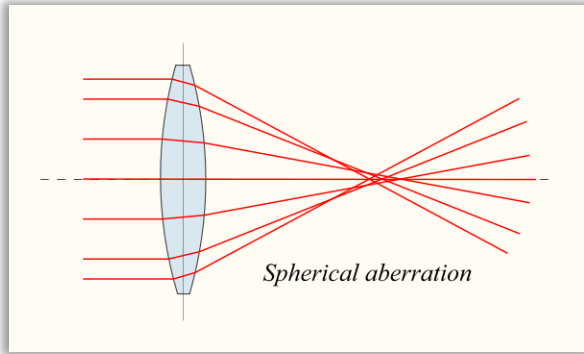
The thin lens model assumes that the lens has no thickness, but this is rarely true...



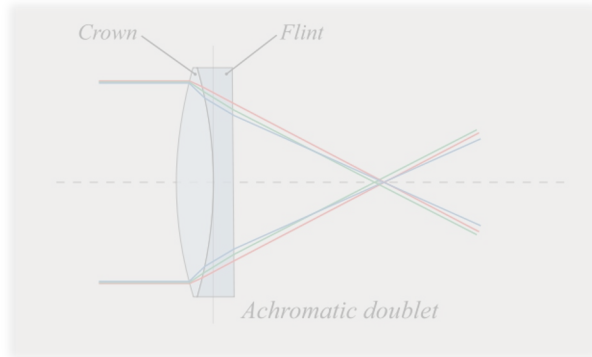
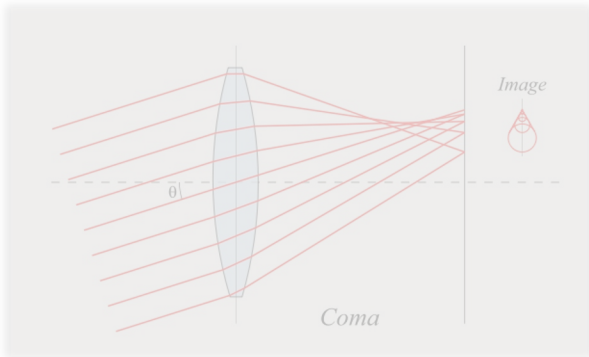
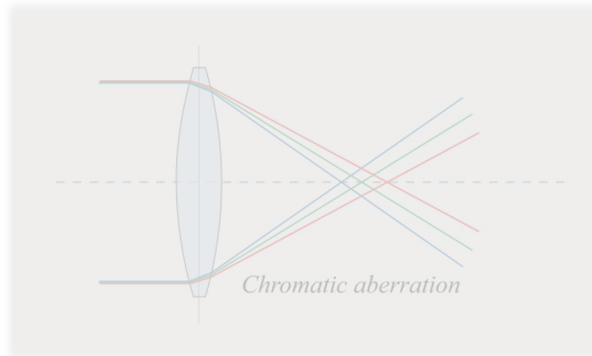
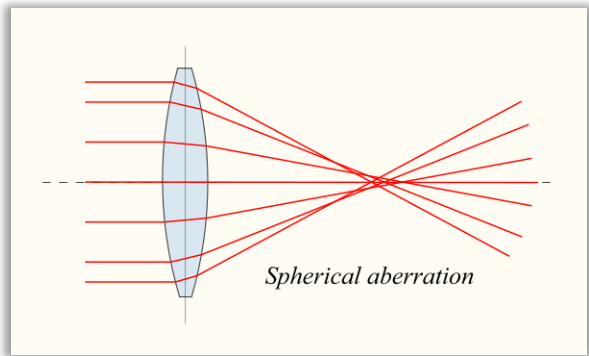
- Even though we have multiple lenses, the entire optical system can be (paraxially) described using a single thin lens of some equivalent focal length and aperture number.

To make real lenses behave like ideal thin lenses, we have to use combinations of multiple lens elements (compound lenses).

# Lenses - Aberrations

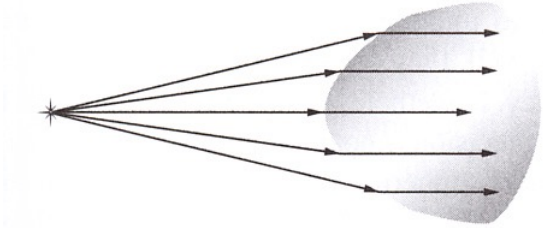


# Lenses - Aberrations



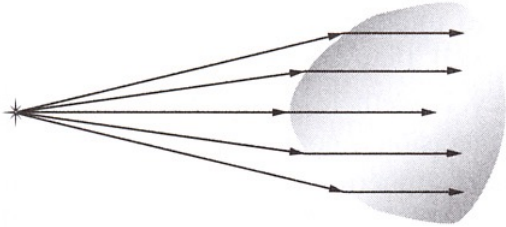
# Refraction at interfaces of complicated shapes

What shape should an interface have to make parallel rays converge to a point?



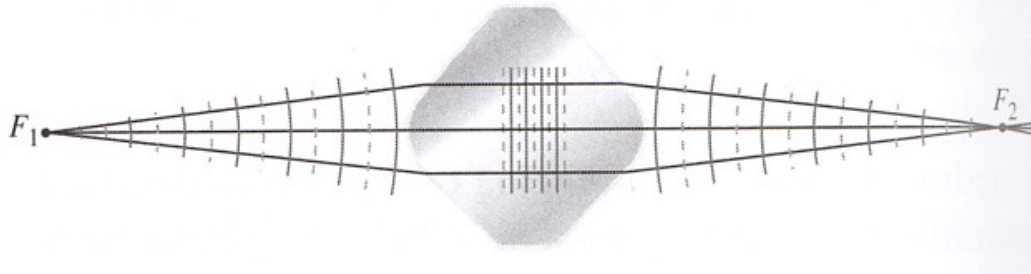
# Refraction at interfaces of complicated shapes

What shape should an interface have to make parallel rays converge to a point?



Single hyperbolic interface:  
point to parallel rays

Double hyperbolic interface:  
point to point rays

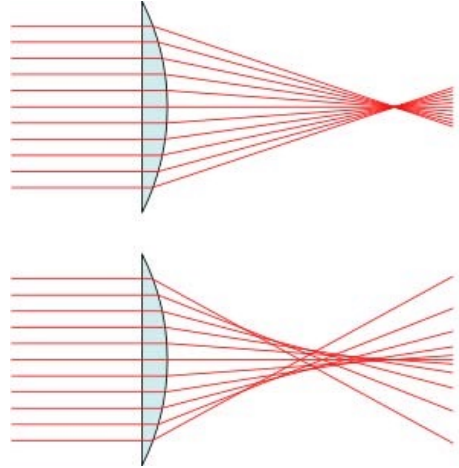
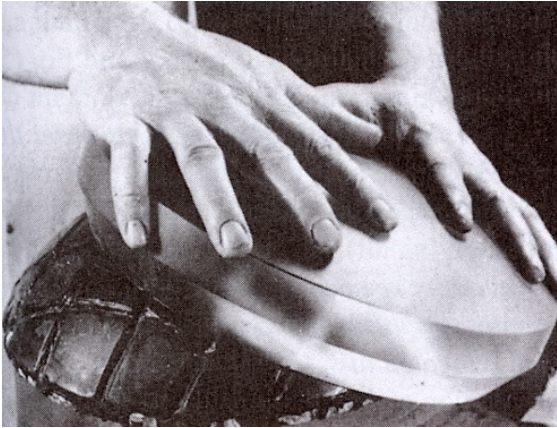


Therefore, lenses should also have hyperbolic shapes.

# Spherical lenses

In practice, lenses are often made to have spherical interfaces for ease of fabrication.

- Two roughly fitting curved surfaces ground together will eventually become spherical.



Spherical lenses don't bring parallel rays to a point.

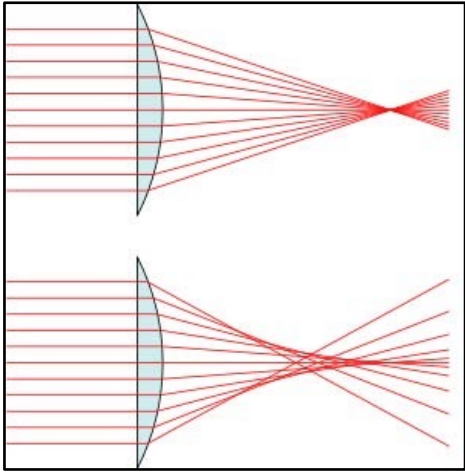
- This is called spherical aberration.
- Approximately axial (i.e., paraxial) rays behave better.



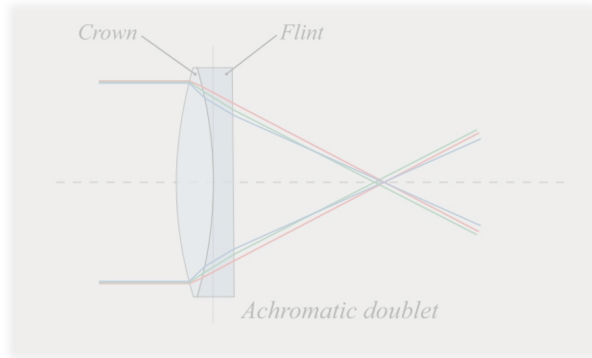
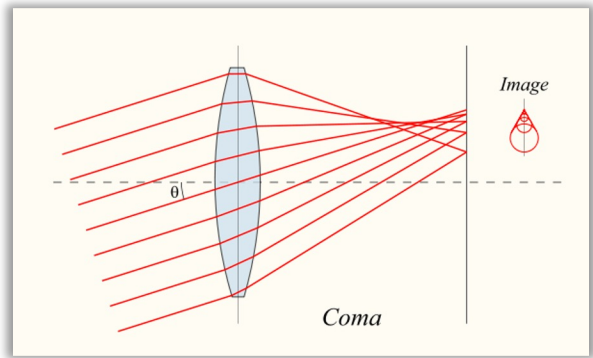
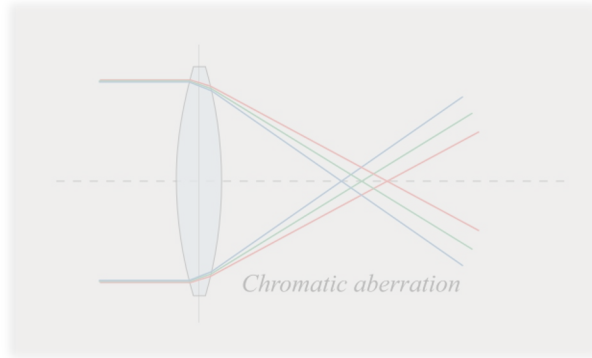
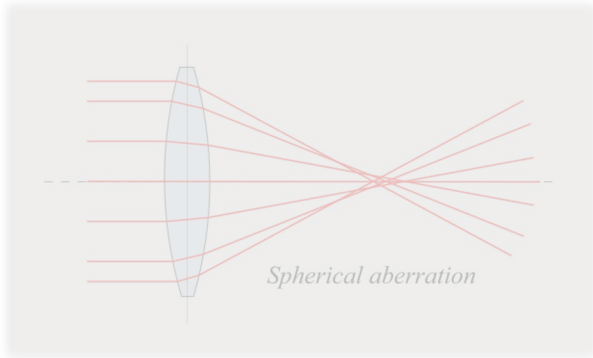
# Aberrations

Deviations from ideal thin lens behavior (e.g., imperfect focus).

- Example: spherical aberration.



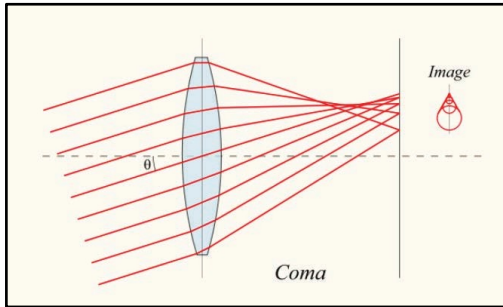
# Lenses - Aberrations



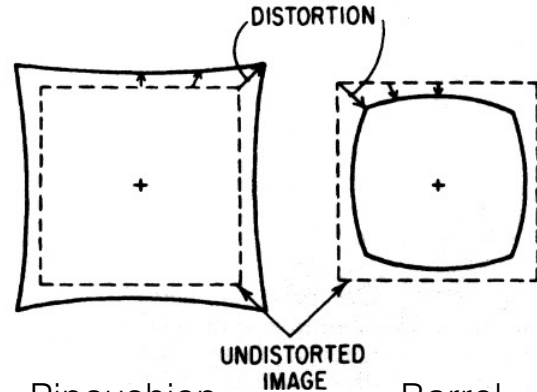
# Oblique aberrations

These appear only as we move further from the center of the field of view.

- Contrast with spherical and chromatic, which appear everywhere.
- Many other examples (astigmatism, field curvature, etc.).



Coma



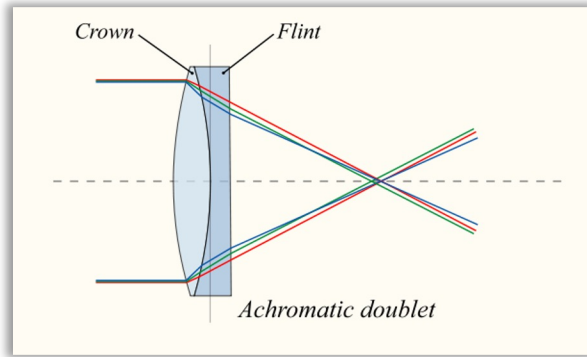
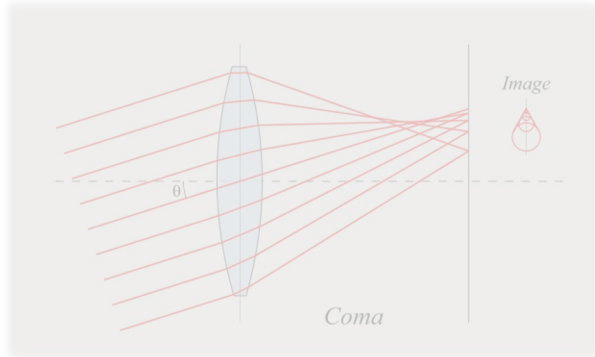
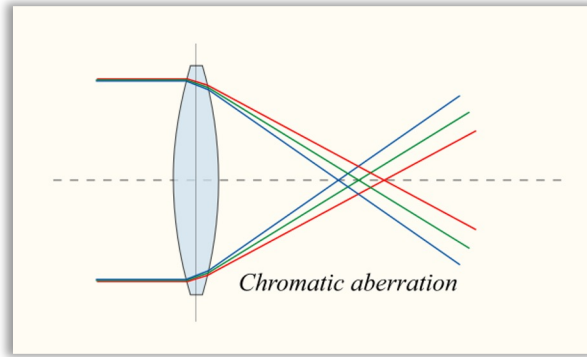
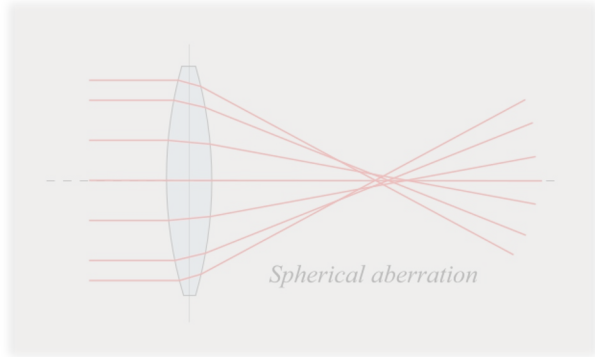
Pincushion

Barrel

# Distortion example



# Lenses - Aberrations

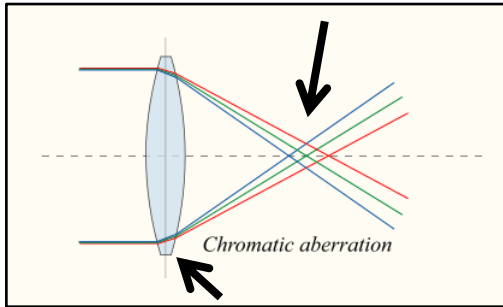


# Aberrations

Deviations from ideal thin lens behavior (e.g., imperfect focus).

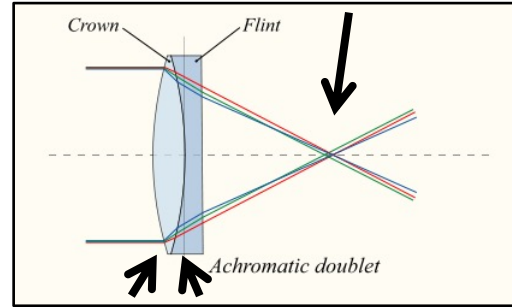
- Example: chromatic aberration.

focal length shifts with wavelength



glass has dispersion (refractive index changes with wavelength)

one lens cancels out dispersion of other



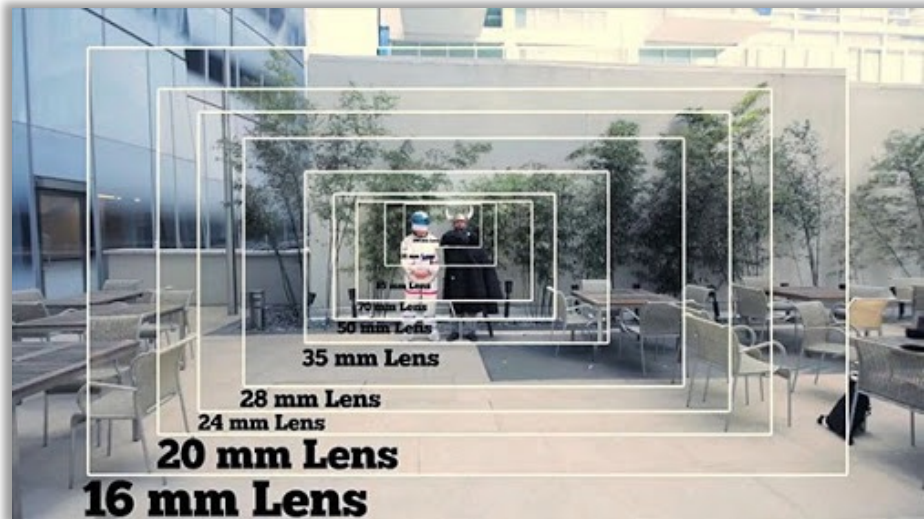
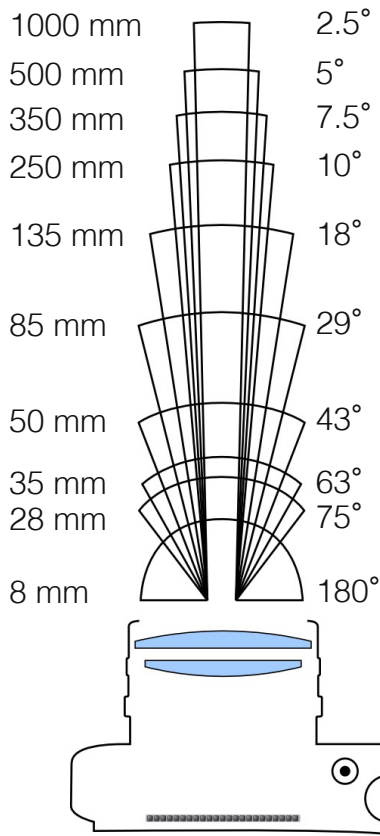
glasses of different refractive index

Using a doublet (two-element compound lens), we can reduce chromatic aberration.

# Chromatic aberration examples



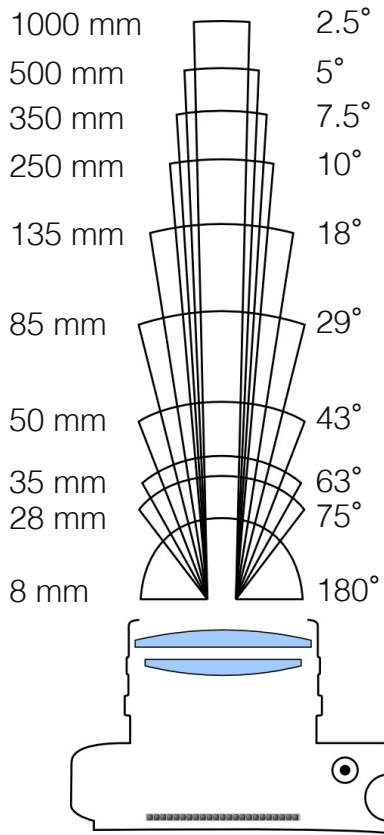
# Field of View



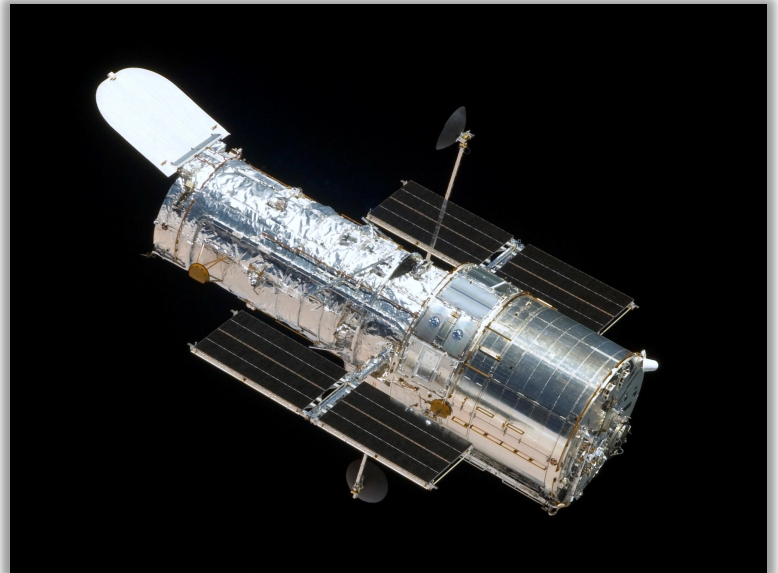
Andrew McWilliams



# Field of View



Hubble – what's the focal length?



# A costly aberration

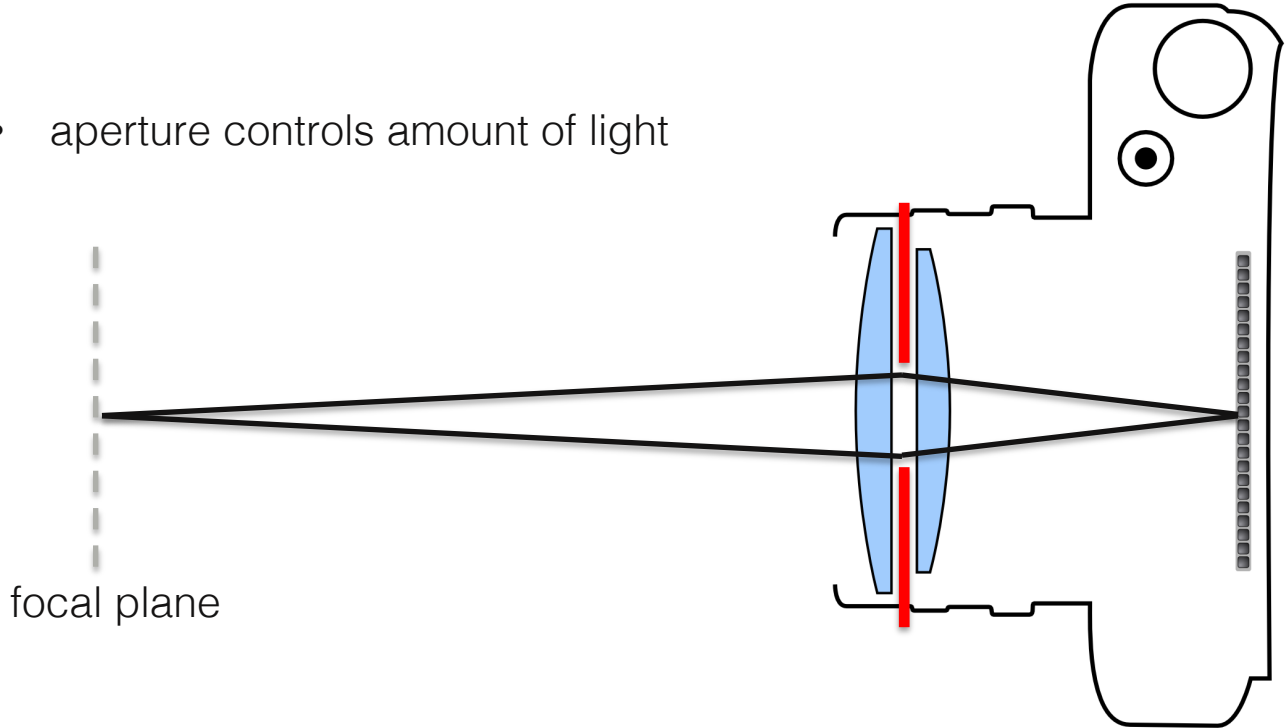
Hubble telescope originally suffered from severe spherical aberration.

- COSTAR mission inserted optics to correct the aberration.



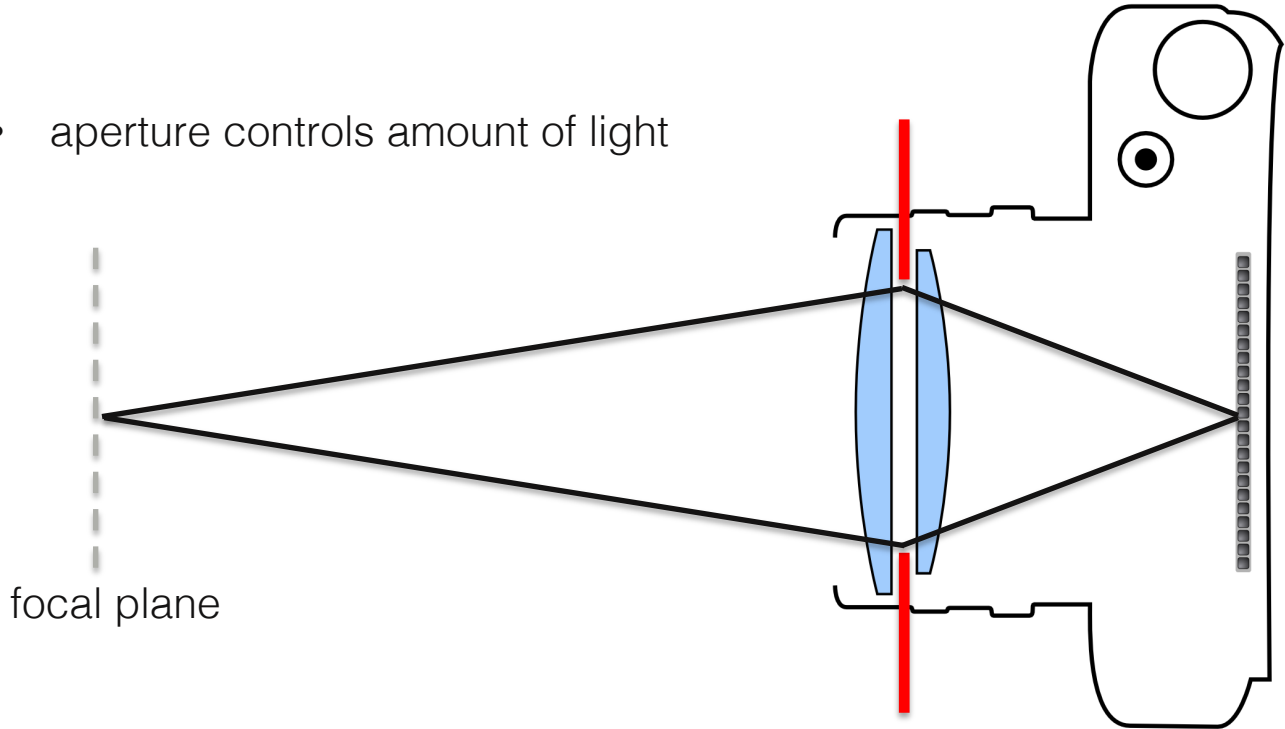
# Aperture

- aperture controls amount of light



# Aperture

- aperture controls amount of light



# Aperture size

Most lenses have variable aperture size.

- F-number notation: “f/1.4” means  $f / = 1.4$  (focal length / diameter).
- Usually aperture sizes available at steps of one-half or one-third stops.
- Older lenses have separate manual aperture ring.
- Modern lenses control the aperture through a dial on the camera body (“gelled” lenses).



f/1.4



f/2.8



f/4



f/8



f/16

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f/1.4



f/2.8



f/4



f/8



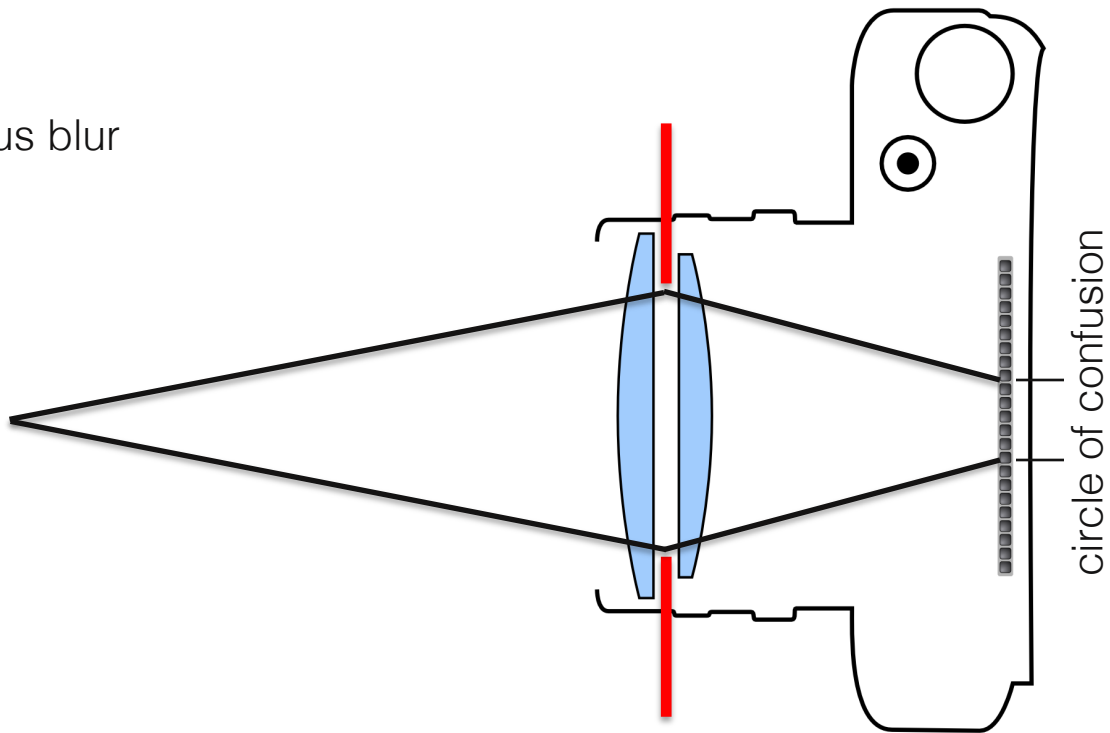
f/16

Reminder: A “stop” changes the amount of light by a factor of 2.

# Aperture

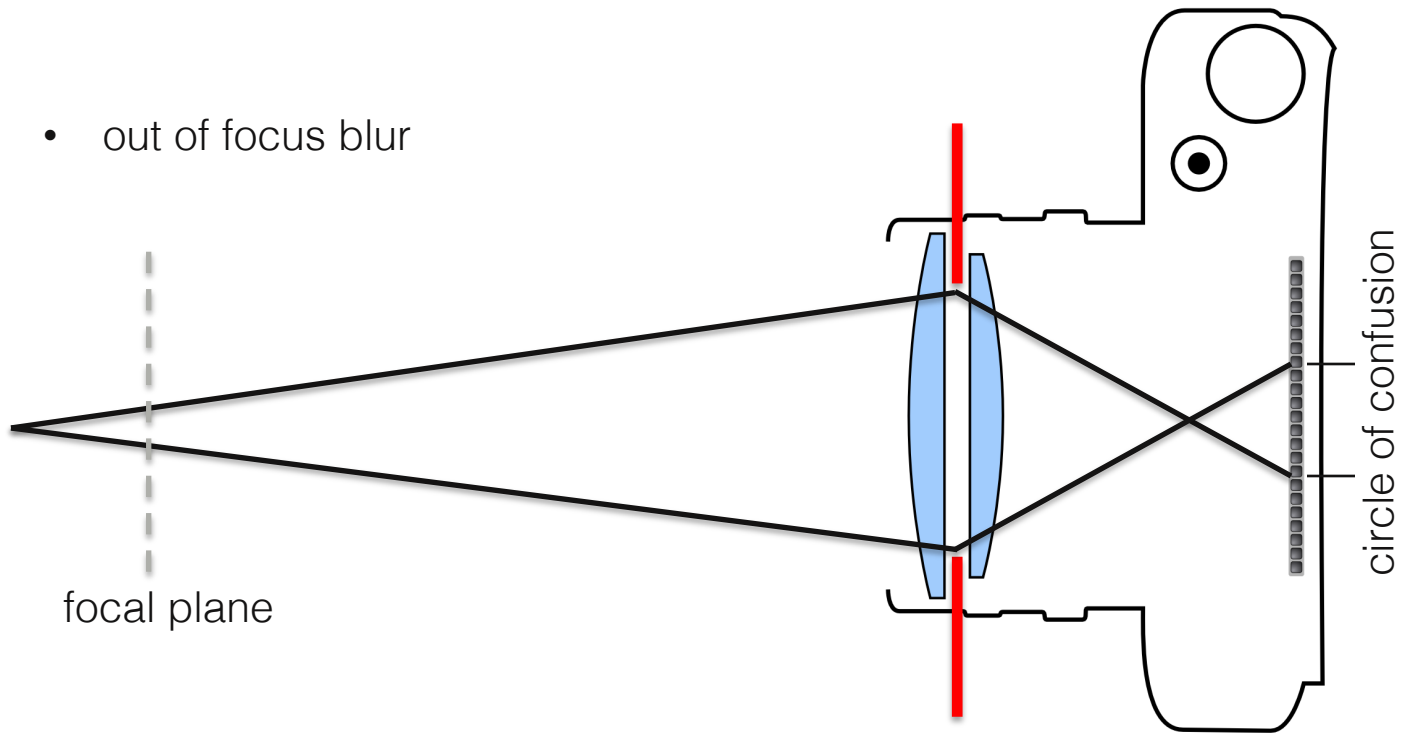
- out of focus blur

focal plane



# Aperture

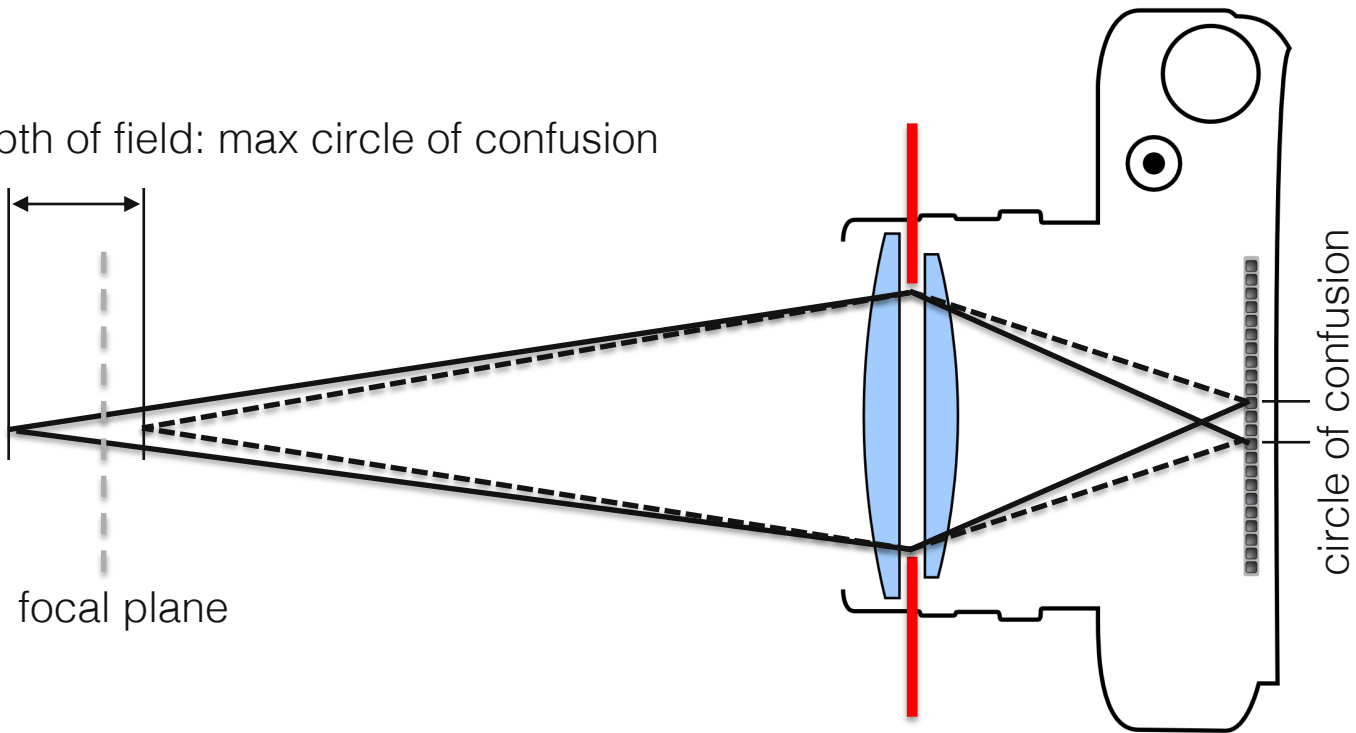
- out of focus blur





# Depth of Field

depth of field: max circle of confusion



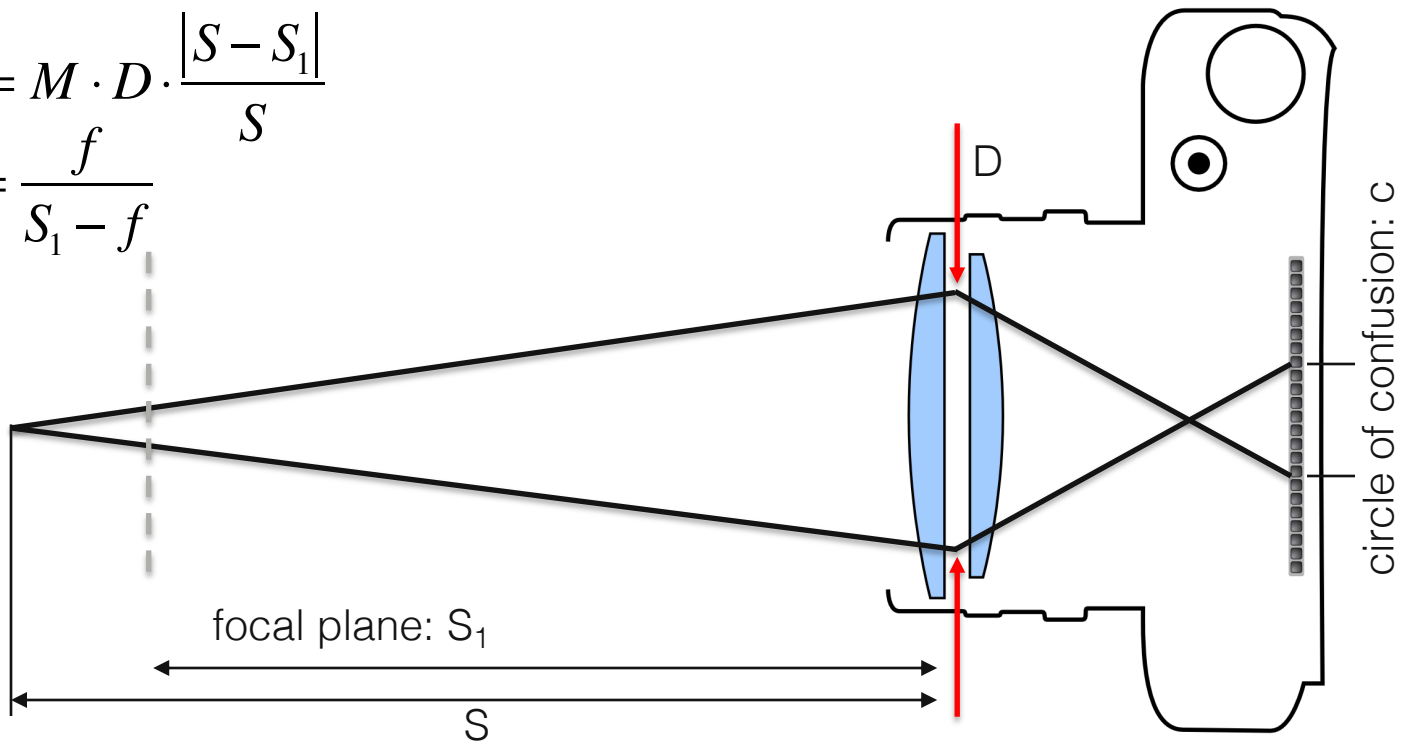
focal plane

circle of confusion

# Circle of Confusion

$$c = M \cdot D \cdot \frac{|S - S_1|}{S}$$

$$M = \frac{f}{S_1 - f}$$

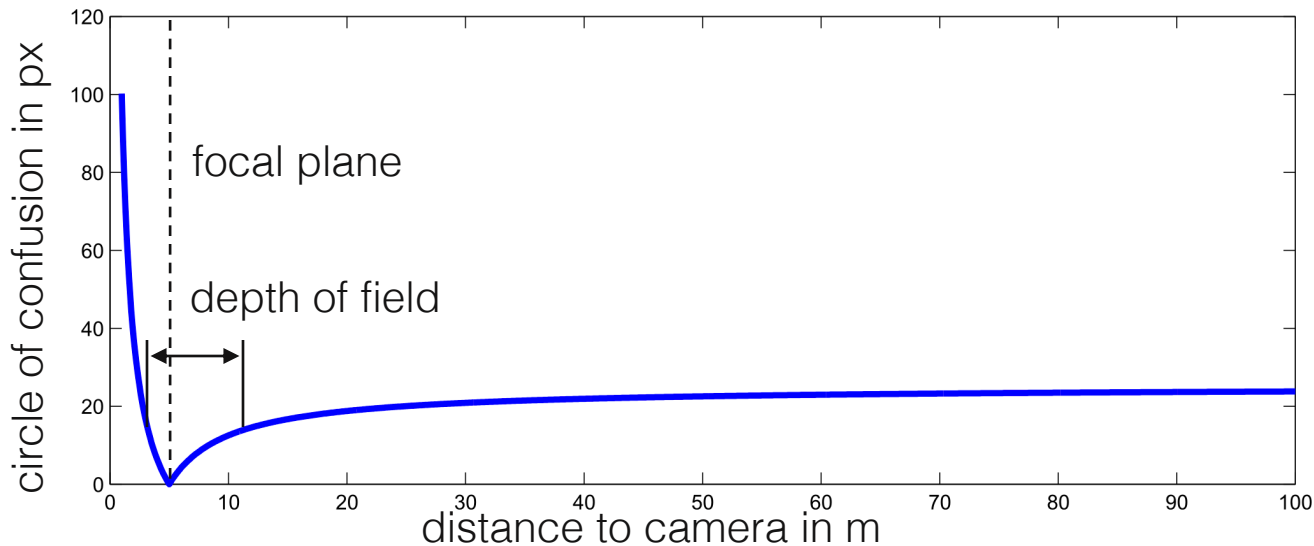


# Circle of Confusion

$$c = M \cdot D \cdot \frac{|S - S_1|}{S}$$

Canon 5D Mark III:  $f=50\text{mm}$ ,  $f/2.8$  ( $N=2.8$ ),

focused at  $5\text{m}$ , pixel size= $7.5\mu\text{m}$

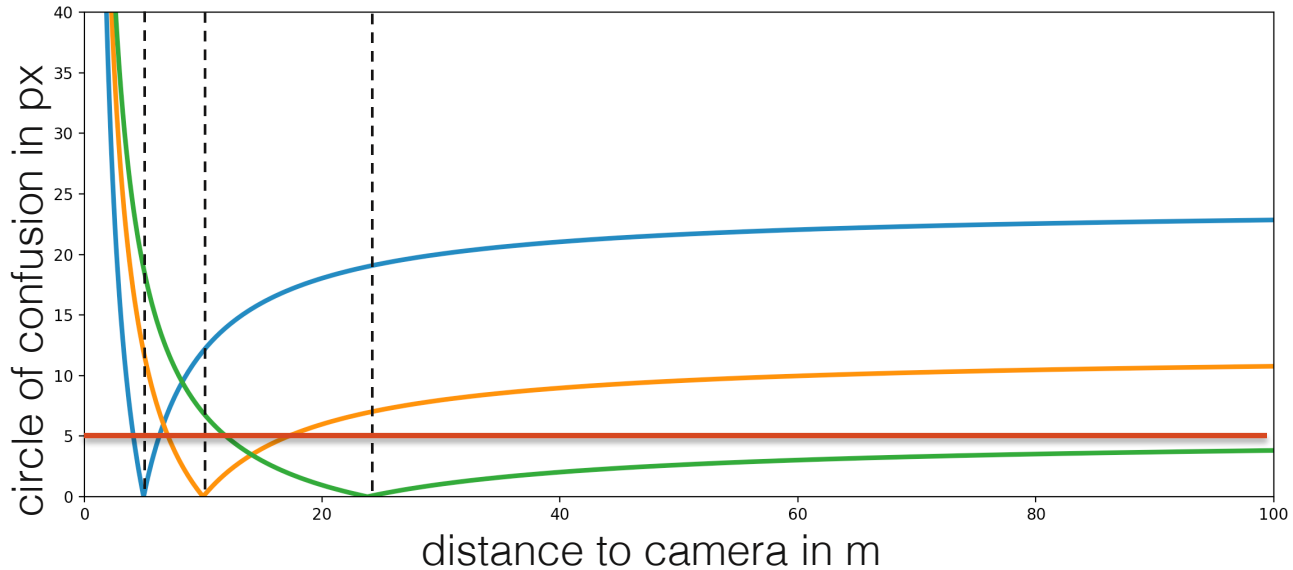


# Hyperfocal Distance

$$H = \frac{f^2}{Nc}$$

Canon 5D Mark III:  $f=50\text{mm}$ ,  $f/2.8$  ( $N=2.8$ ),

focused at  $5\text{m}$ , pixel size= $7.5\mu\text{m}$

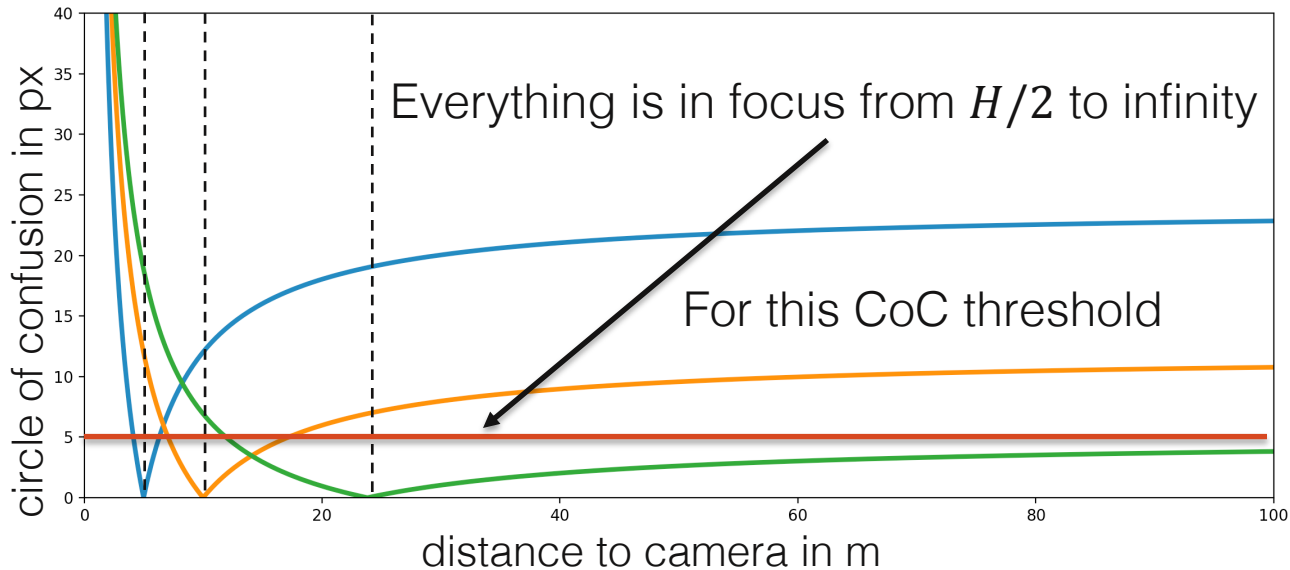


# Hyperfocal Distance

$$H = \frac{f^2}{Nc}$$

Canon 5D Mark III:  $f=50\text{mm}$ ,  $f/2.8$  ( $N=2.8$ ),

focused at 5m, pixel size= $7.5\mu\text{m}$



# Depth of Field

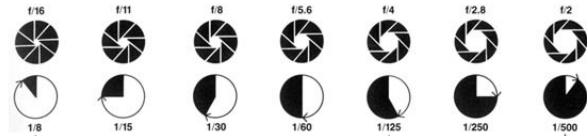


aperture....f 1.8  
shutter.....1/500  
ISO.....100  
distance...~3ft

aperture....f 4  
shutter.....1/125  
ISO.....100  
distance...~3ft

aperture....f 8  
shutter.....1/40  
ISO.....125  
distance...~3ft

# Depth of Field & Motion Blur



# Bokeh

artistic use



two delighted blog

coded aperture

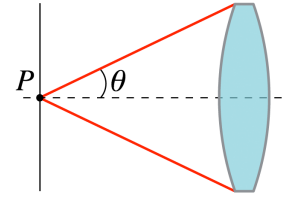


Levin et al., SIGGRAPH 2007

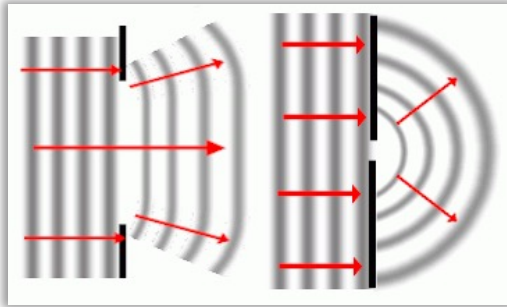


# Diffraction Limit

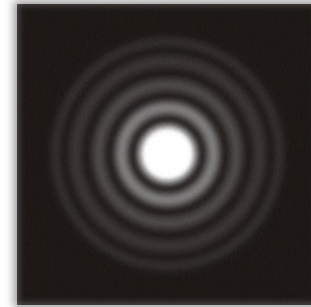
- Ernst Abbe 1873:  $d = \frac{\lambda}{2n \sin \theta}$   
spot radius (image space)



diffraction



Airy pattern

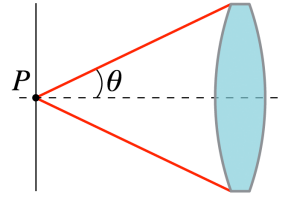


# Diffraction Limit

- Ernst Abbe 1873: 
$$d = \frac{\lambda}{2n \sin \theta} = \frac{\lambda}{2NA} \approx \lambda N$$

↑ numerical aperture

f-number ↓



- microscope objectives today: NA 1.4-1.6  $\rightarrow d = \lambda/2.8$
- small f-number (large NA) = high resolution but shallow depth of field
  - inherent tradeoff between “3D” information and 2D resolution
  - space-bandwidth product (uncertainty principle)

# Fastest lens ever made?

Zeiss 50 mm f / 0.7 Planar lens



- Originally developed for NASA's Apollo missions.
- Stanley Kubrick somehow got to use the lens to shoot Barry Lyndon under only candlelight.

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Zeiss 50 mm f / 0.7 Planar lens



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Sensors

# What's a Pixel?

Anatomy of the Active Pixel Sensor Photodiode

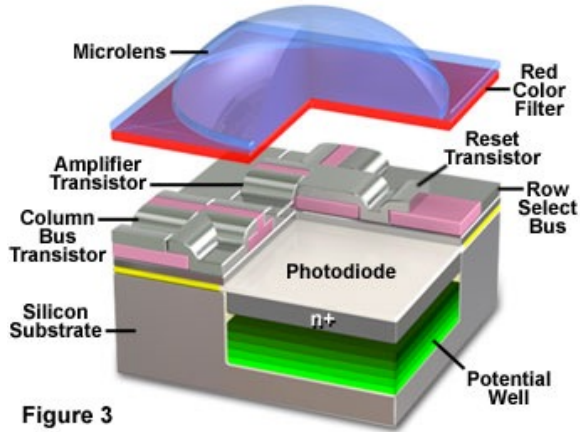
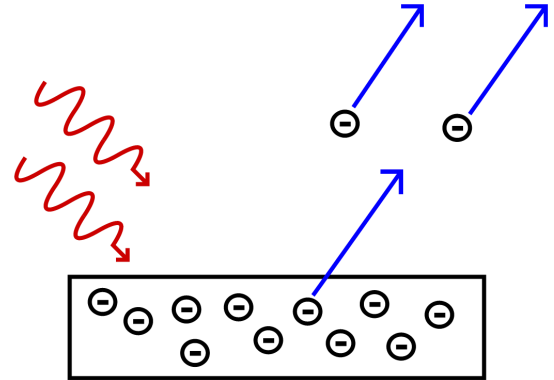


Figure 3

source: Molecular Expressions

photon to electron converter

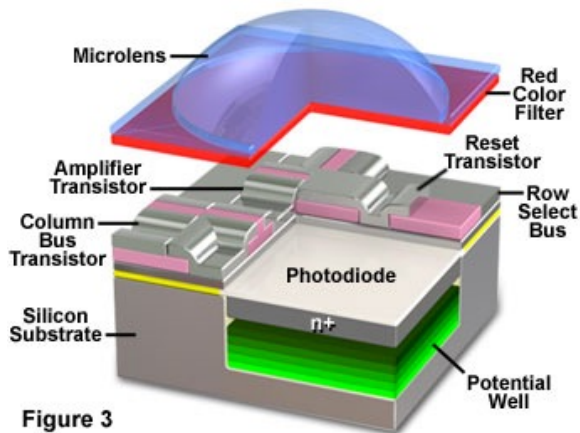
→ photoelectric effect!



wikipedia

# What's a Pixel?

Anatomy of the Active Pixel Sensor Photodiode



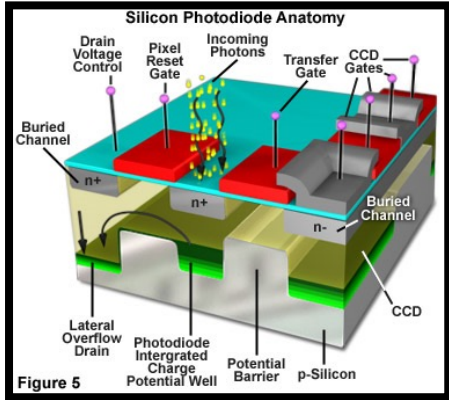
source: Molecular Expressions

- microlens: focus light on photodiode
- color filter: select color channel
- quantum efficiency: ~50%
- fill factor: fraction of surface area used for light gathering

Two main types of imaging sensors

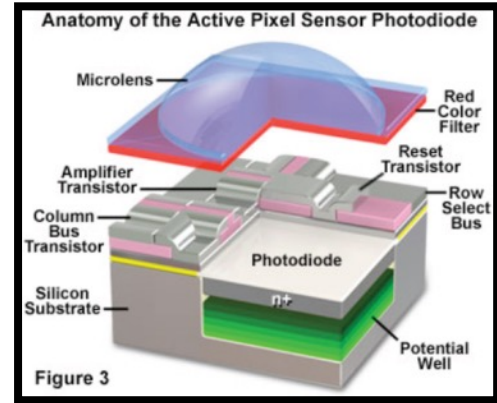


# Two main types of imaging sensors



## Charged coupled device (CCD):

- row brigade shifts charges row-by-row
- amplifiers convert charges to voltages row-by-row

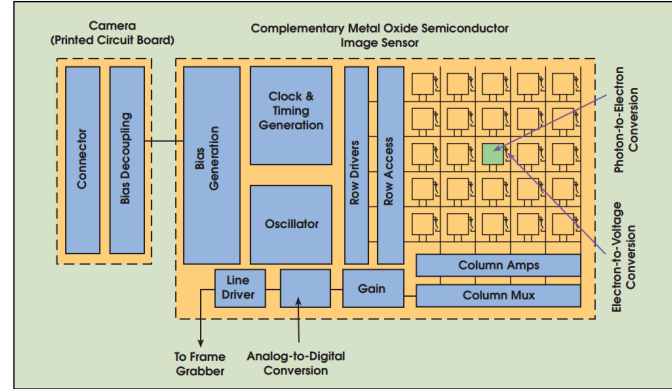
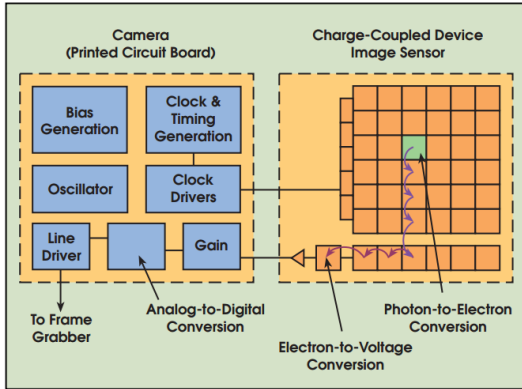


## Complementary metal oxide semiconductor (CMOS):

- per-pixel amplifiers convert charges to voltages
- multiplexer reads voltages row-by-row

Can you think of advantages and disadvantages of each type?

# Two main types of imaging sensors



## Charged coupled device (CCD):

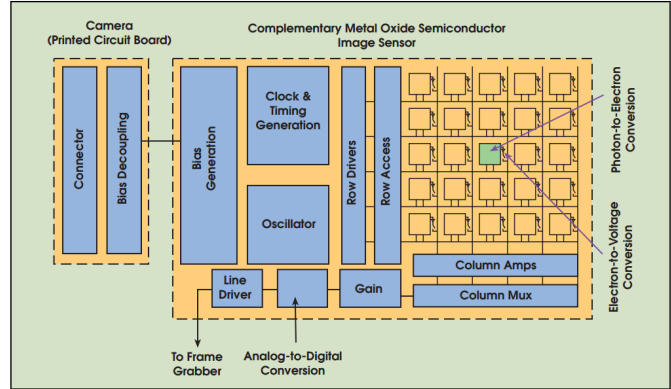
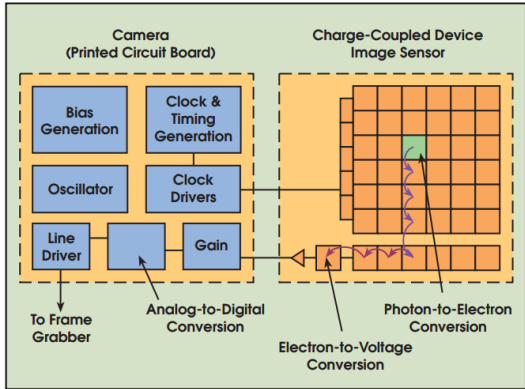
- row brigade shifts charges row-by-row
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## Complementary metal oxide semiconductor (CMOS):

- per-pixel amplifiers convert charges to voltages
- multiplexer reads voltages row-by-row

Can you think of advantages and disadvantages of each type?

# Two main types of imaging sensors



## Charged coupled device (CCD):

- row brigade shifts charges row-by-row
- amplifiers convert charges to voltages row-by-row

- ✓ higher sensitivity
- ✓ lower noise

## Complementary metal oxide semiconductor (CMOS):

- per-pixel amplifiers convert charges to voltages
- multiplexer reads voltages row-by-row

- ✓ faster read-out
- ✓ lower cost

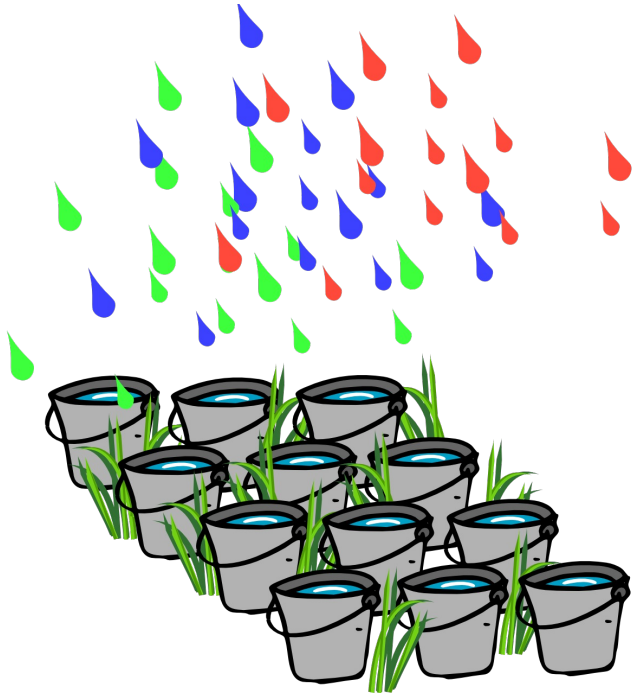
# What's a Pixel?



# What's a Pixel?



# What's a Pixel?

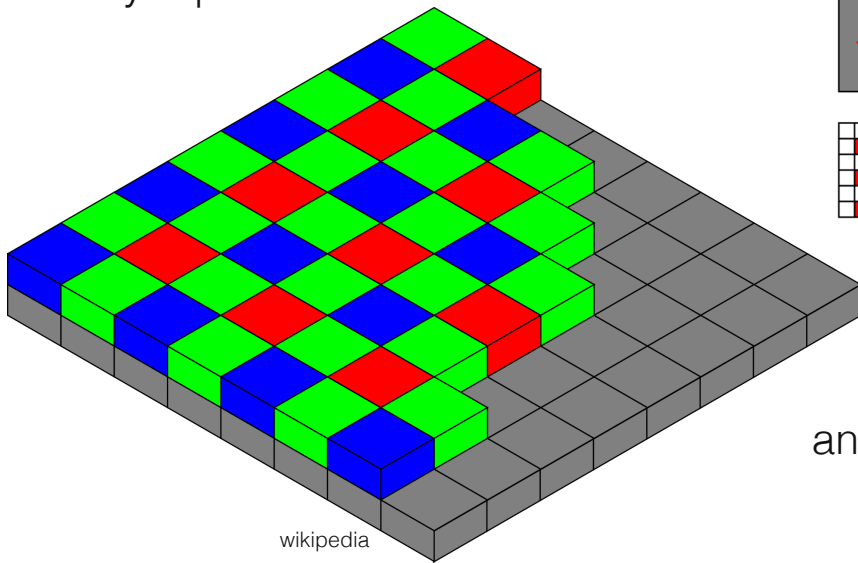


# What's a Pixel?

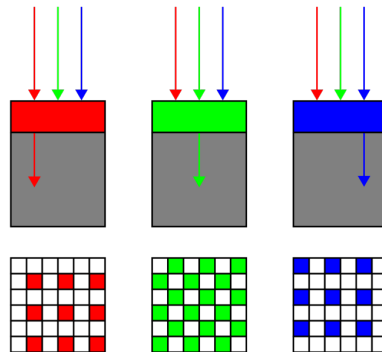


# Most Common: Color Filter Arrays

Bayer pattern

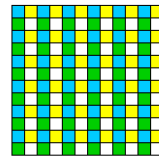
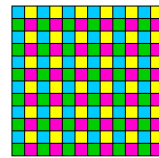
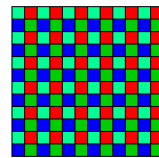
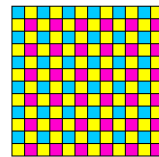
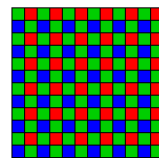


wikipedia



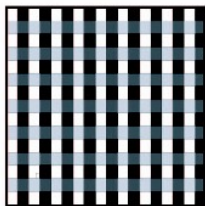
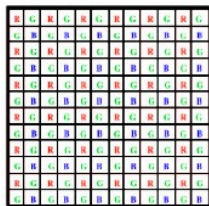
any combination possible

tradeoffs?

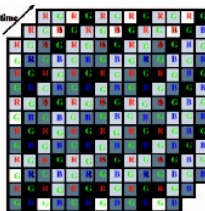
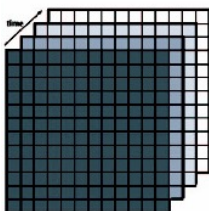
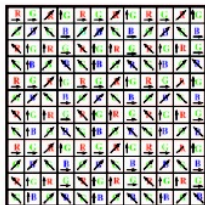
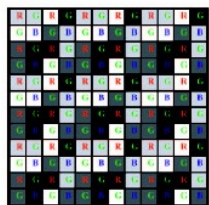




# Assorted Pixels



- Narasimhan & Nayar @ Columbia
- multiplex anything: polarization, color, time, ND, ...



# Exposure (shutter speed)

- exposure = time (e.g. 1/250, 1/60, 1, 15, bulb)



wikipedia

$\frac{1}{4}$  sec, f/3.3



2 sec, f/6.3

# ISO (“film speed”)

sensor

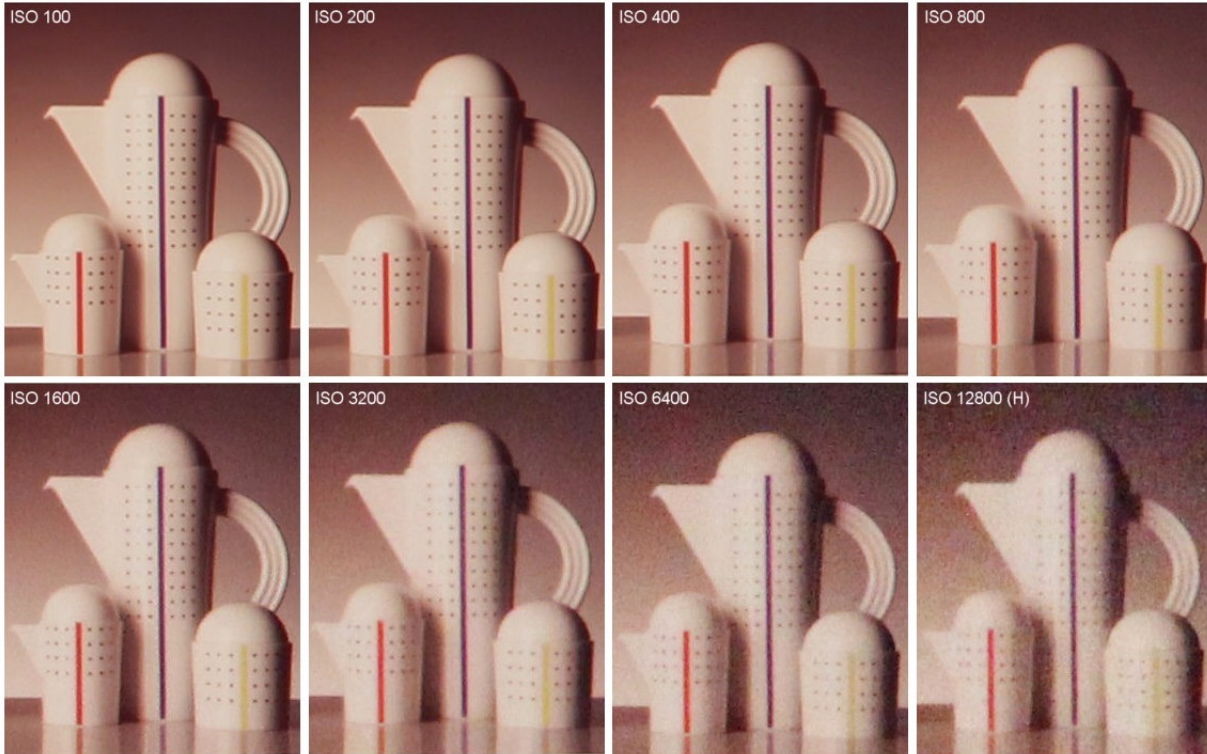
sensitivity

–

analog gain

applied before

ADC!



# Dynamic Range

- ratio between largest and smallest possible value
- bit depth also important! common bit depths: 12-14 bits RAW / 8 bits JPEG

high dynamic range →



Kevin McCoy

# Global Shutter vs. Rolling Shutter



All sensor pixels exposed at same time



Row-by-row readout of image

- shorter exposure times per pixel
- motion artifacts

What are these  
dark bands?



60 Hz AC power results in 120 Hz flicker!



0.026000 s 1000 fps 997  $\mu$ s

*YouTube: user cameratest*



[Sheinin et al. '17]



26 frames over 10 ms



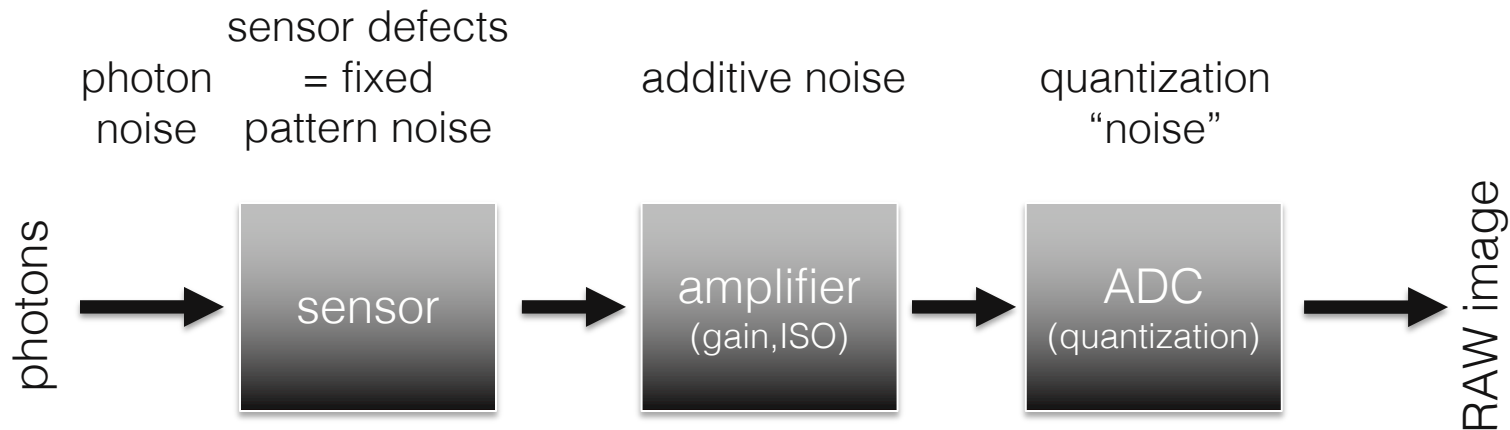
[Sheinin et al. '17]

26 frames over 10 ms



[Sheinin et al. '17]

# Photons to RAW Image

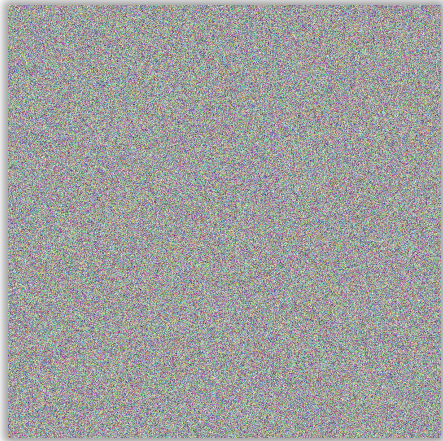


# Sensor Noise

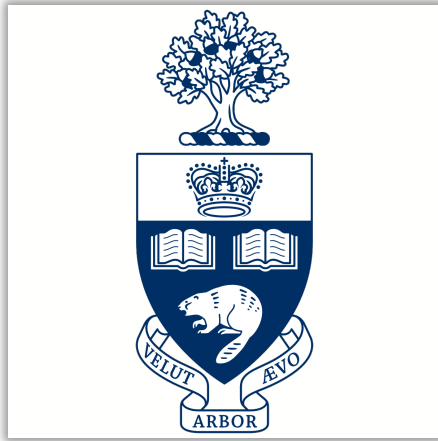
- noise is (usually) bad!
- many sources of noise: heat, electronics, amplifier gain, photon to electron conversion, pixel defects, read, ...
- different noise follows different statistical distributions, two crucial ones:
  - Gaussian
  - Poisson

# Gaussian Noise

- thermal, read, amplifier
- additive, signal-independent!



+



=



# Photon or Shot Noise

- signal dependent
- Poisson distribution:

$$f(k; \lambda) = \frac{\lambda^k e^{-\lambda}}{k!}$$

$$\sigma = \sqrt{\lambda}$$

N photons:  $\sigma = \sqrt{N}$

2N photons:  $\sigma = \sqrt{2} \sqrt{N}$

nonlinear!



# Signal-to-Noise Ratio (SNR)

$$SNR = \frac{\text{mean pixel value}}{\text{standard deviation of pixel value}} = \frac{\mu \longleftarrow \text{signal}}{\sigma \longleftarrow \text{noise}}$$
$$= \frac{PQ_e t}{\sqrt{PQ_e t + Dt + N_r^2}}$$

$P$  = incident photon flux (photons/pixel/sec)

$Q_e$  = quantum efficiency

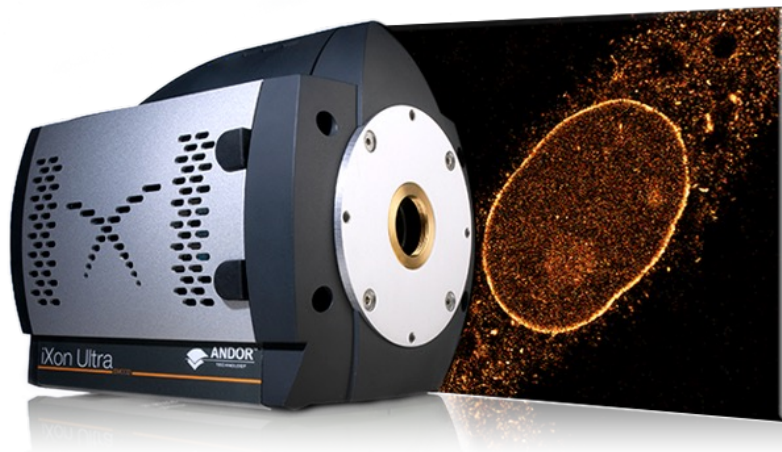
$t$  = exposure time (sec)

$D$  = dark current (electrons/pixel/sec), including hot pixels

$N_r$  = read noise (rms electrons/pixel), including fixed pattern noise

# Scientific Sensors

- e.g., Andor iXon Ultra 897: cooled to  $-100^{\circ}$  C
- scientific CMOS & CCD
- reduce pretty much all noise, except for photon noise





# Digital Photography

- optics
- aperture
- depth of field
- field of view
- exposure
- noise
- color filter arrays
- image processing pipeline

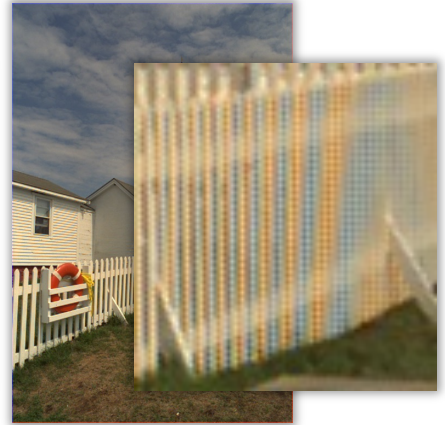
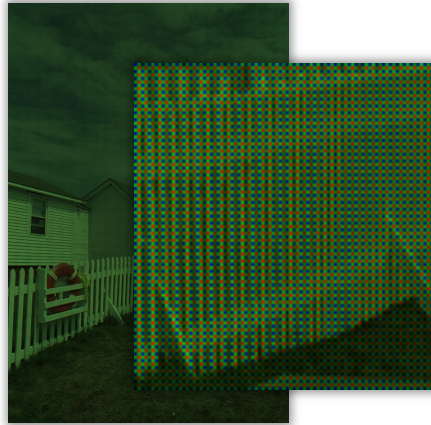


# Digital Photography – Additional Resources

- What we left out: metering, autofocus, autoexposure, anti-aliasing filter, IR filter (and probably much more)
- Stanford CS 178 – Digital Photography: slides, applets, and other material online
- CMU Computational Photography 15-862
- looking for a camera? check [dpreview.com](http://dpreview.com)

# Next: The Image Processing Pipeline

- RAW images
- demosaicking
- denoising
- deblurring
- white balancing
- gamma correction
- compression



# References and Further Reading

- London, Upton, Stone, "Photography", Pearson, 11<sup>th</sup> edition, 2013
- Stanford CS 178, "Digital Photography", Course Notes
- CMU Computational Photography course
- wikipedia