



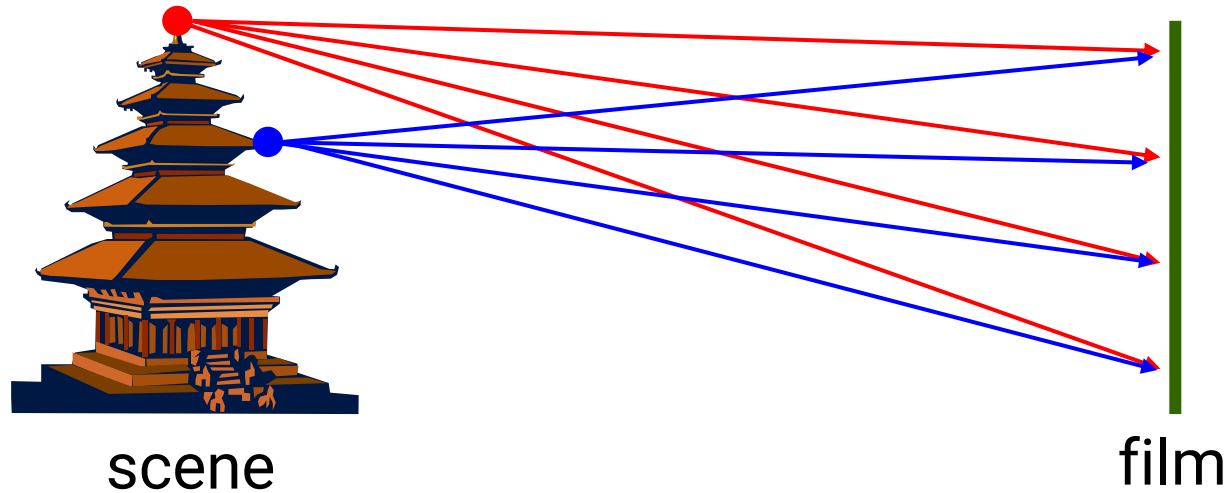
# Camera

## Multimedia Techniques & Applications

Yu-Ting Wu

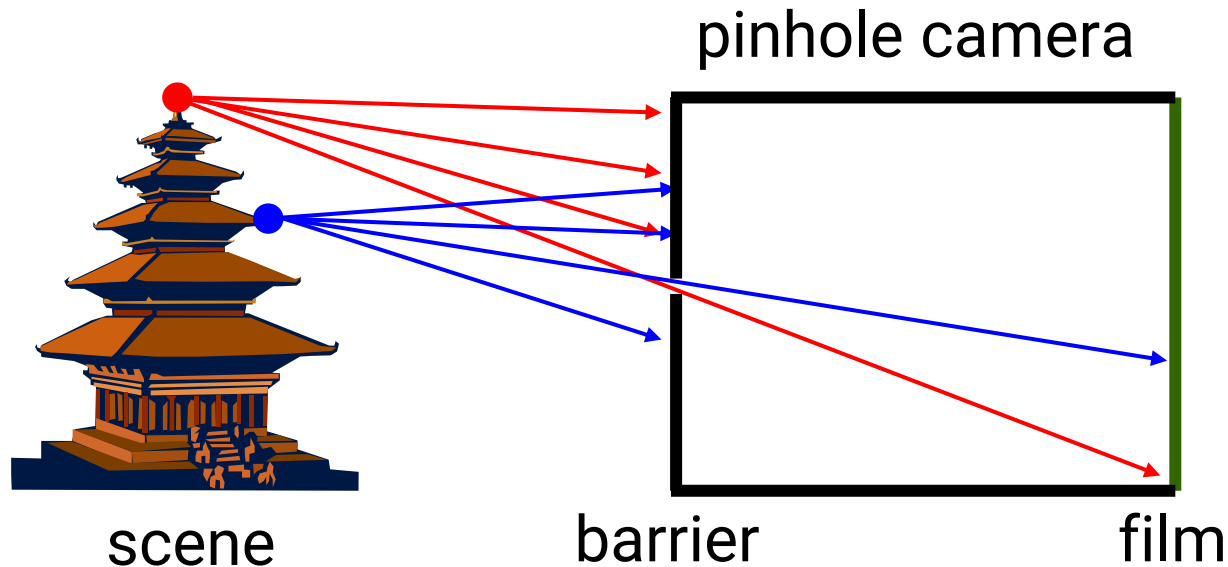
*(this slides are borrowed from Prof. Yung-Yu Chuang)*

# Camera Trial



Put a piece of film in front of an object

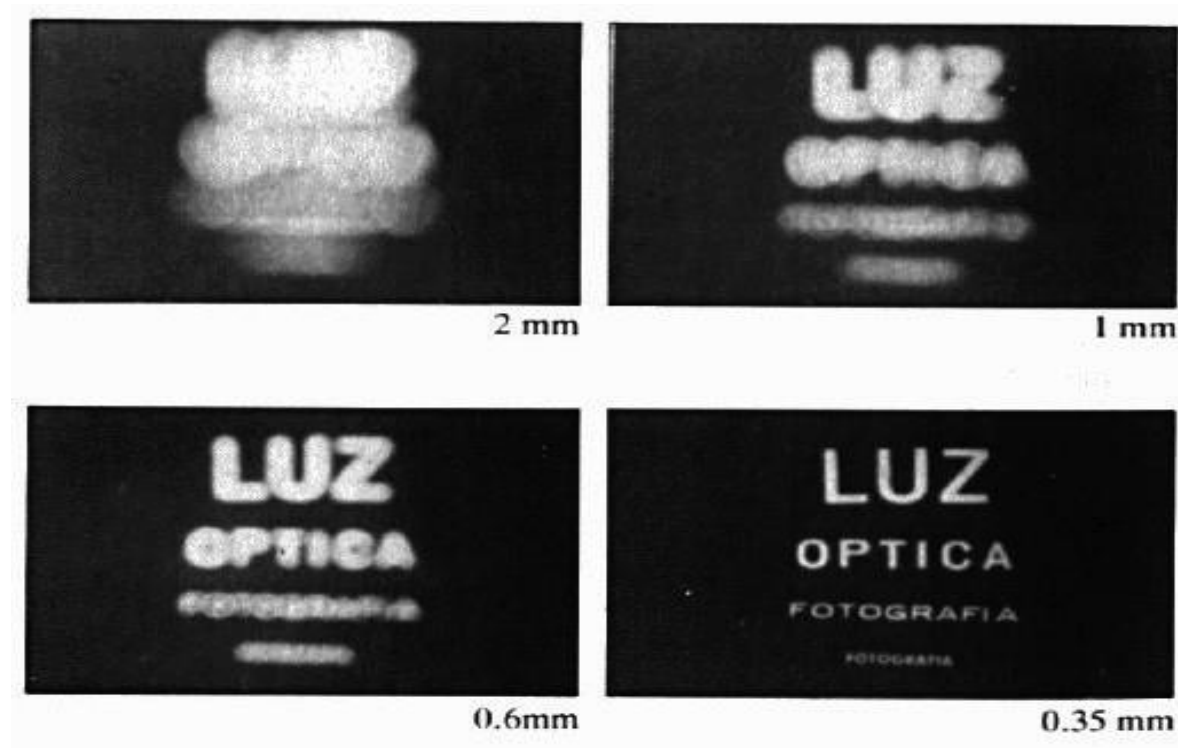
# Pinhole Camera



Add a barrier to block off most of the rays

- It reduces blurring
- The pinhole is known as the aperture
- The image is inverted

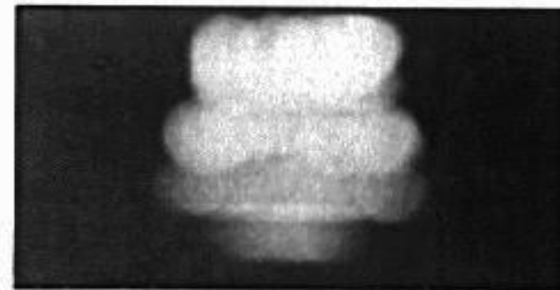
# Shrinking the Aperture



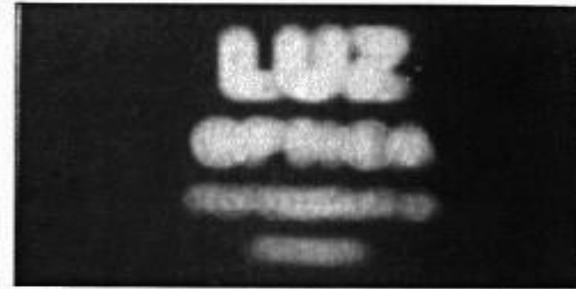
Why not making the aperture as small as possible?

- Less light gets through
- Diffraction effect

# Shrinking the Aperture



2 mm



1 mm



0.6mm



0.35 mm



0.15 mm

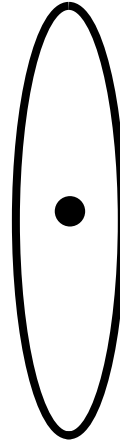


0.07 mm

# Adding a Lens



scene

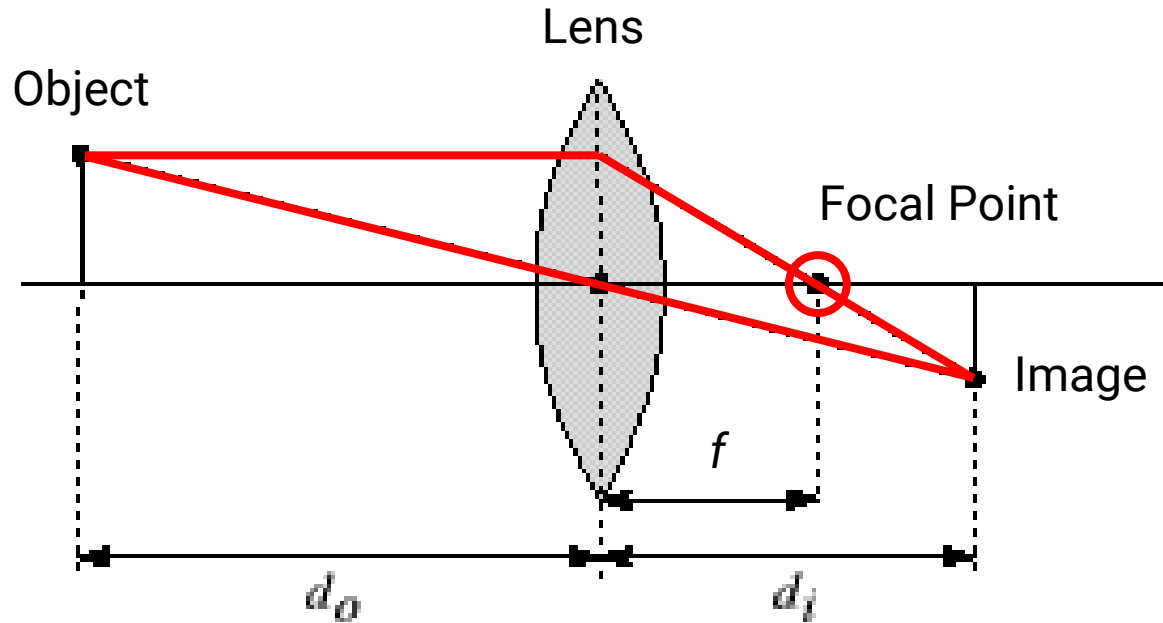


lens



film

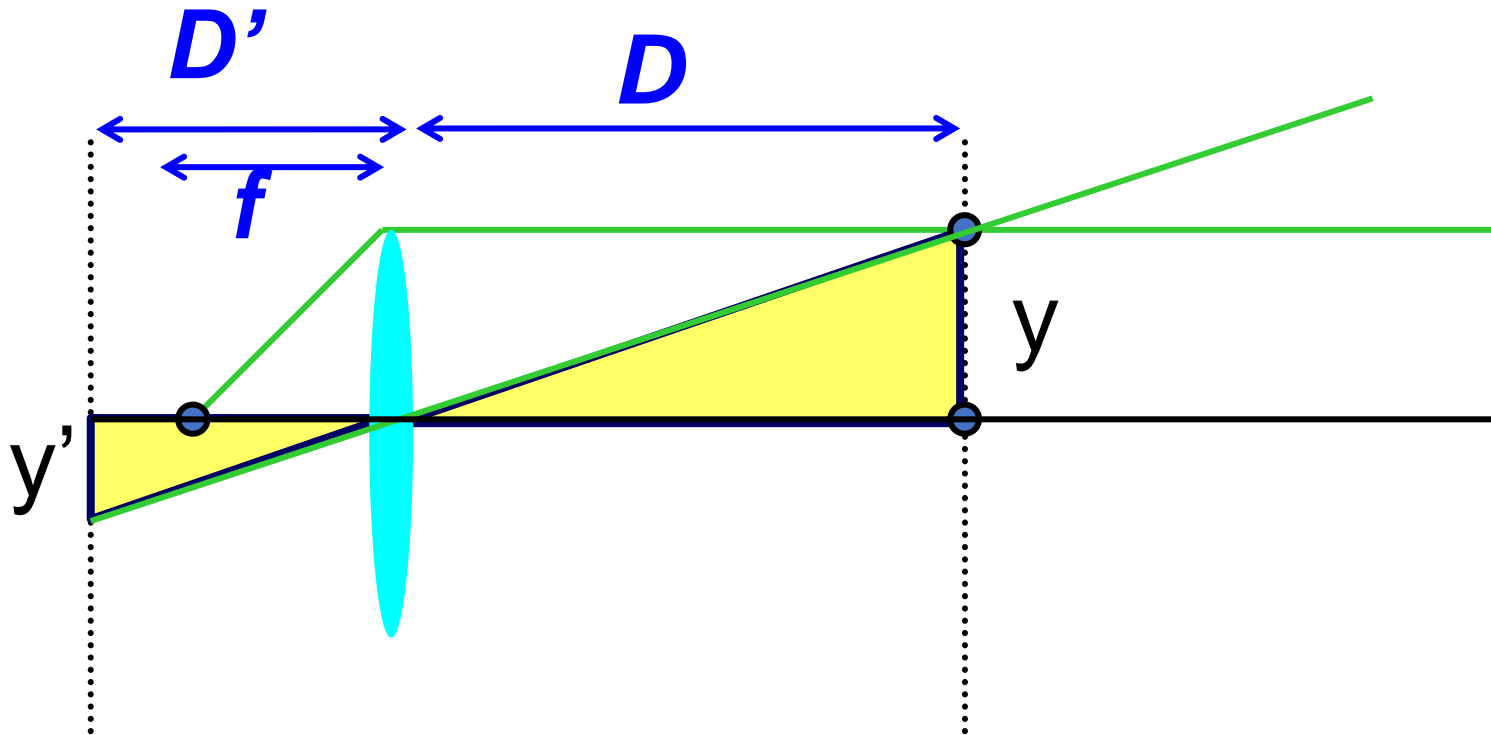
# Lenses



Thin lens equation: 
$$\frac{1}{d_o} + \frac{1}{d_i} = \frac{1}{f}$$

# Thin Lens Formula

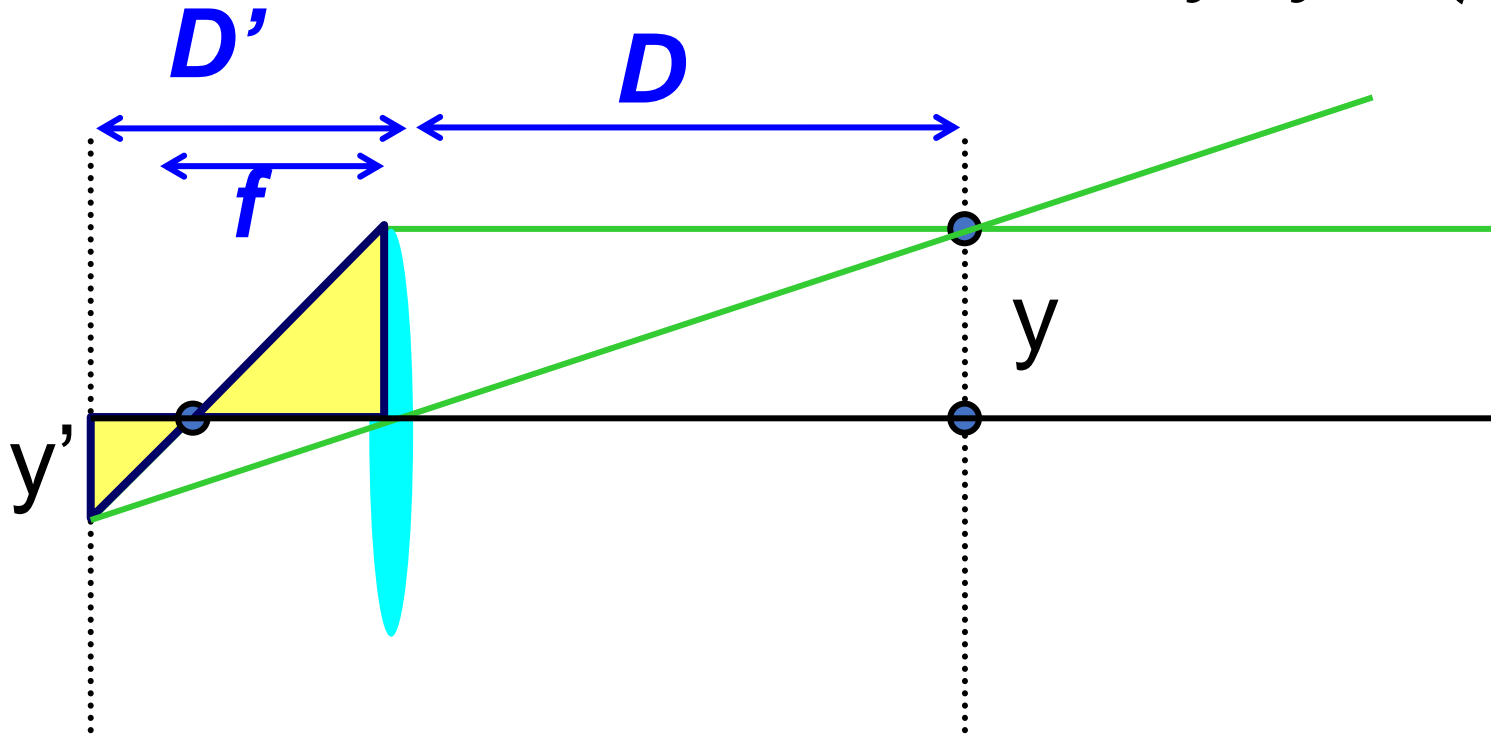
$$y'/y = D'/D$$





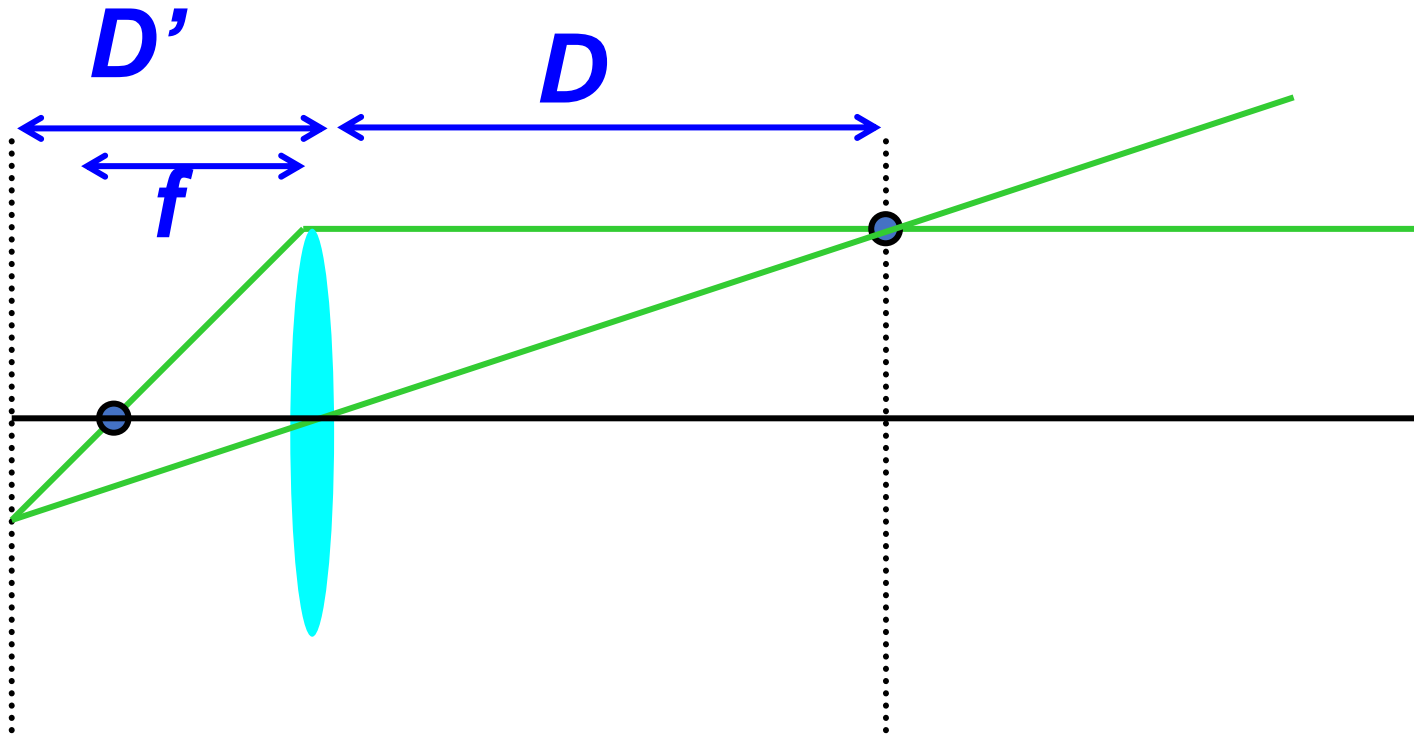
# Thin Lens Formula (cont.)

$$y'/y = D'/D$$
$$y'/y = (D'-f)/f$$

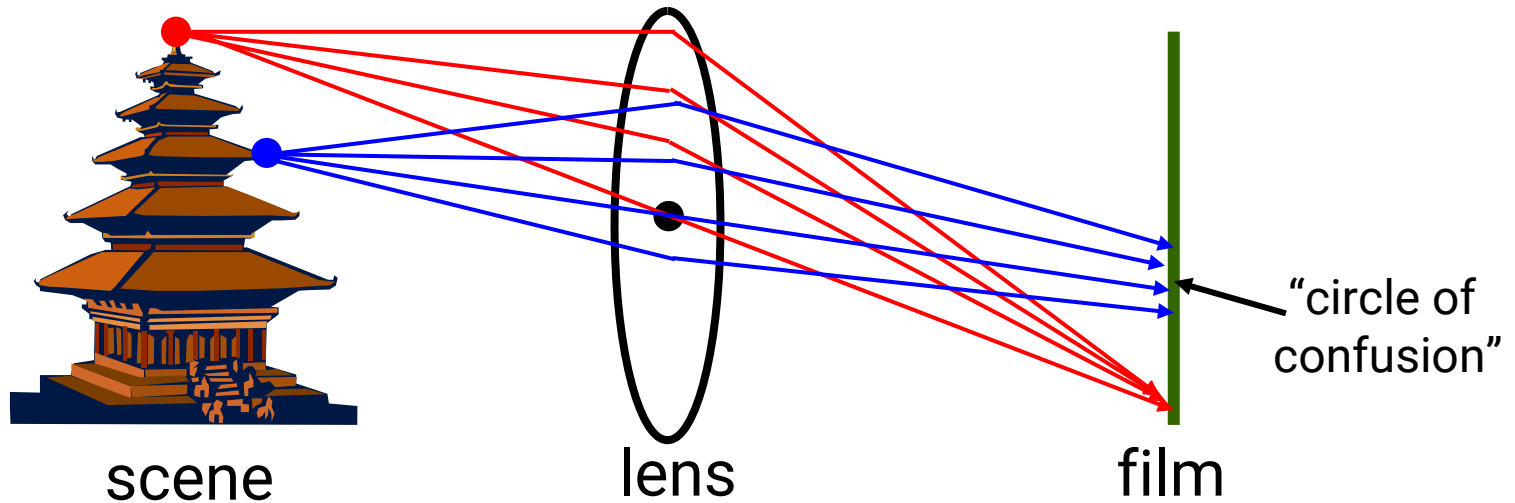


# Thin Lens Formula (cont.)

$$\frac{1}{D'} + \frac{1}{D} = \frac{1}{f}$$



# Adding a Lens (cont.)



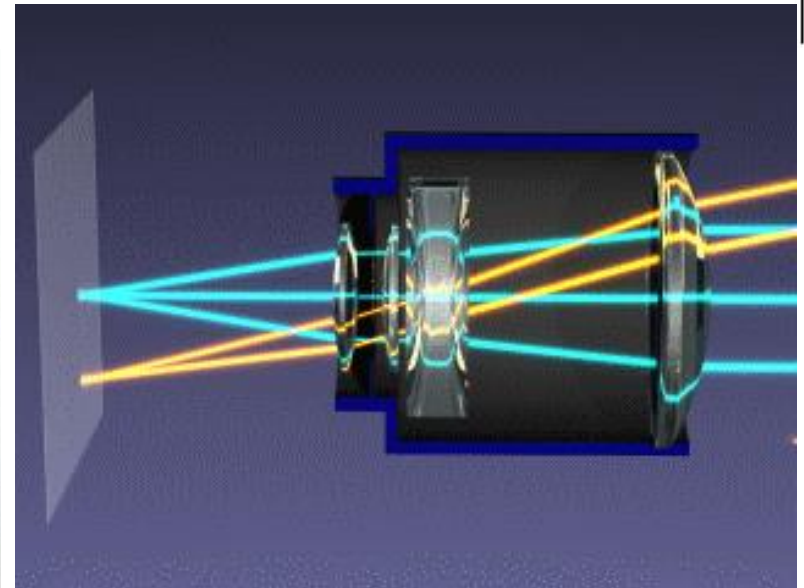
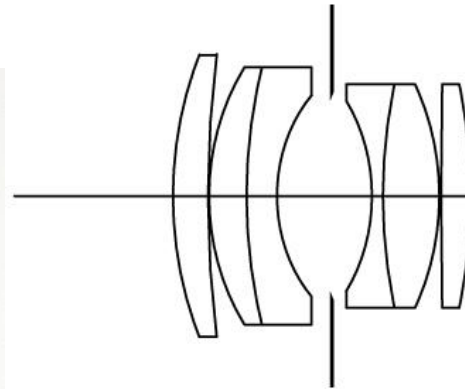
A lens focuses light onto the film

- There is a specific distance at which objects are "in focus"
- Other points project to a "circle of confusion" in the image

# Zoom Lens

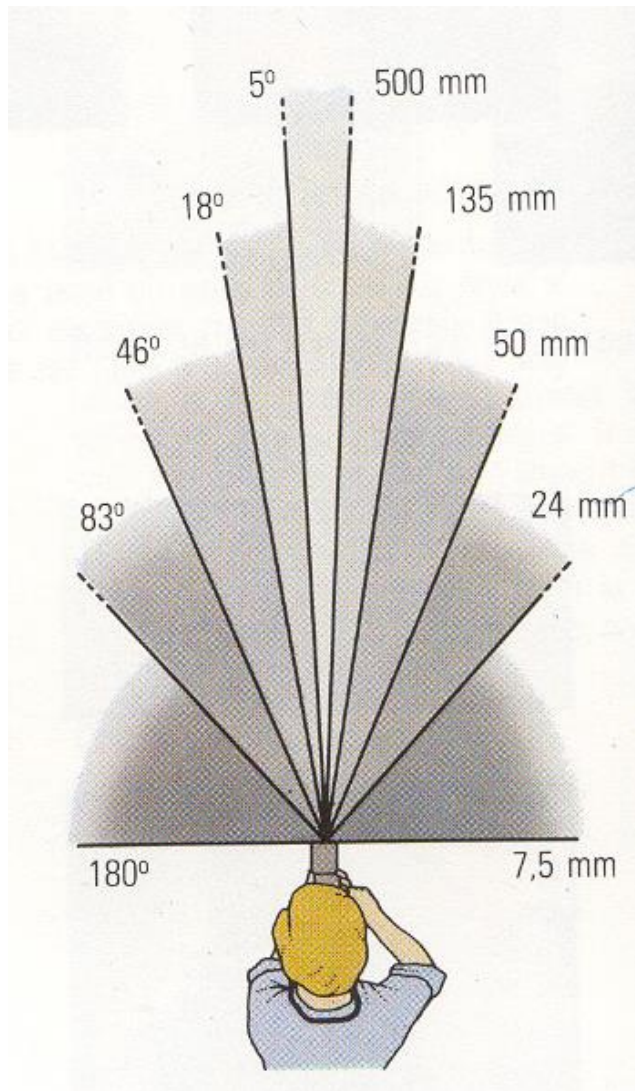
200mm

28mm

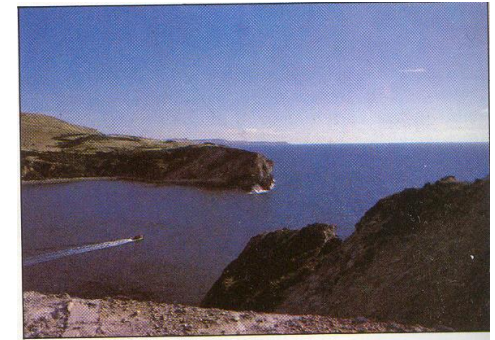


Nikon 28-200mm zoom lens.

# Focal Length in Practice



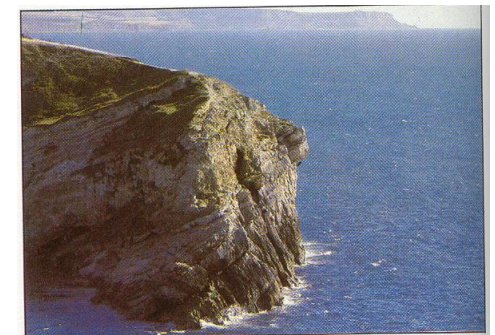
24mm



50mm

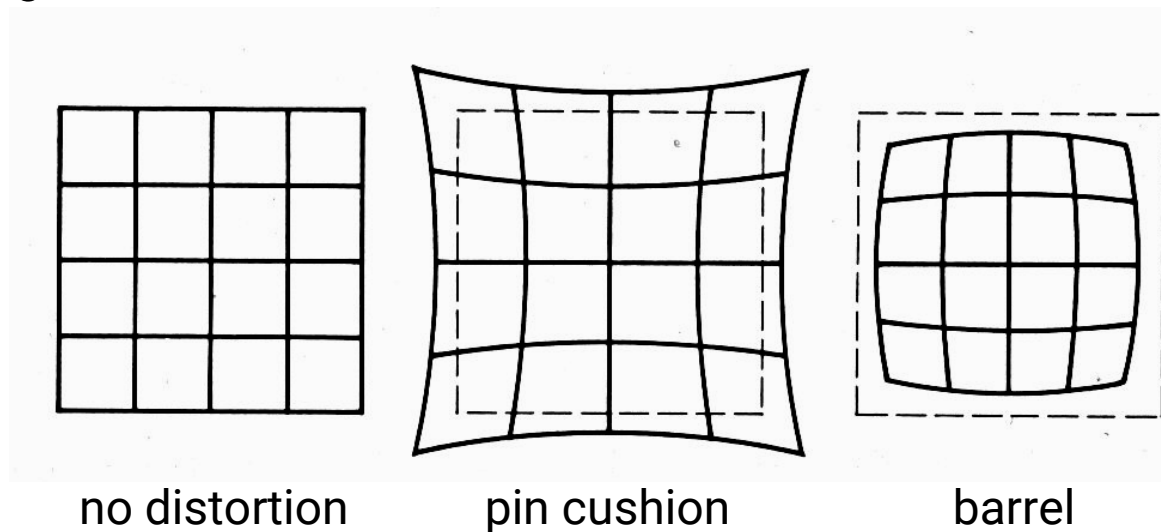


135mm



# Problems with Lens

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



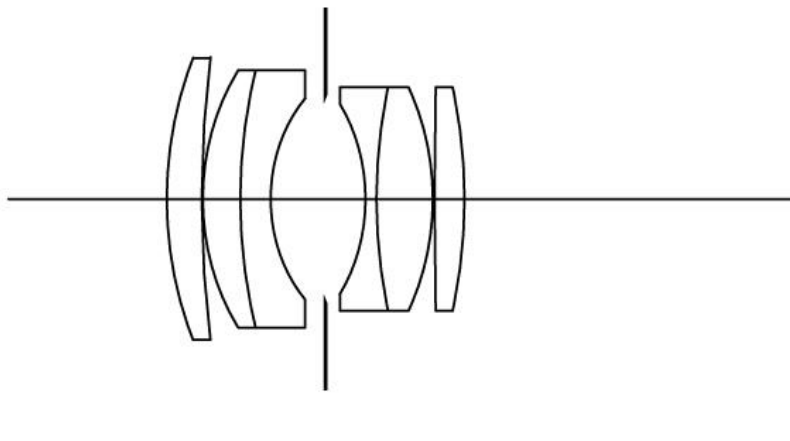
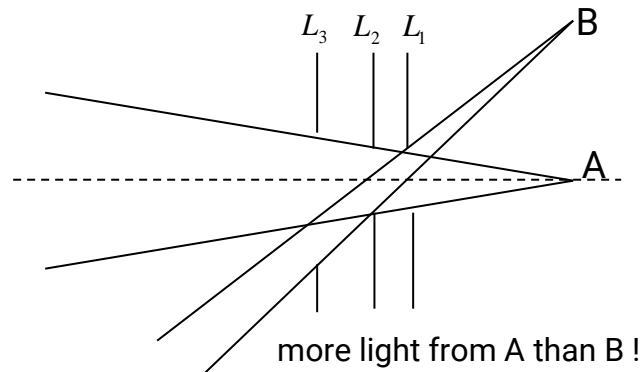
# Problems with Lens (cont.)

- Correcting radial distortion



# Problems with Lens (cont.)

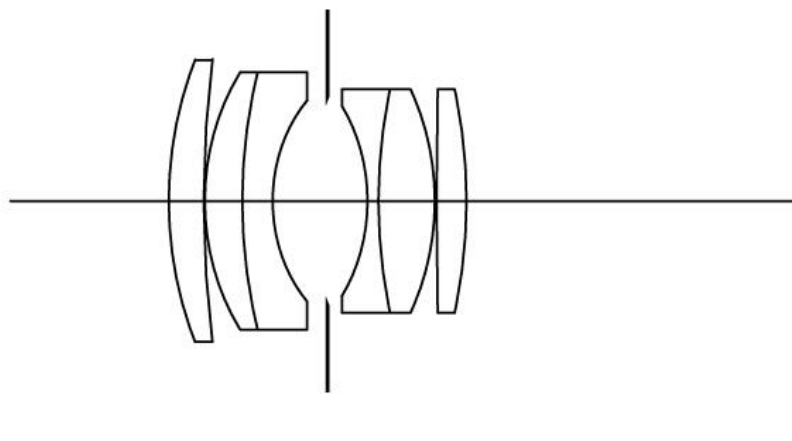
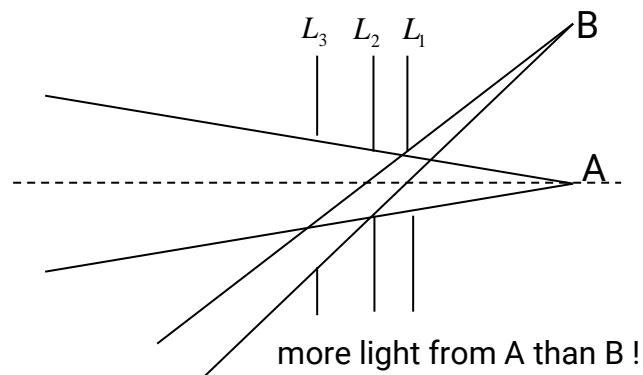
- Vignetting





# Problems with Lens (cont.)

- Vignetting

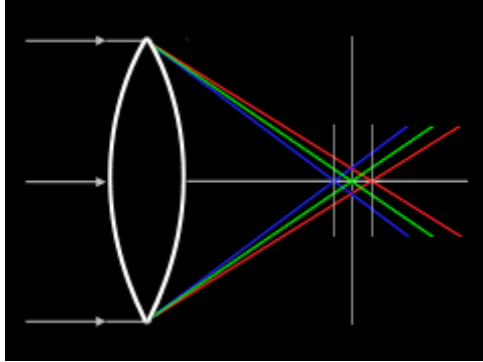


original

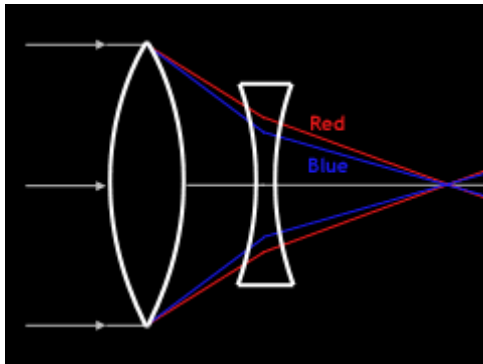
corrected

Goldman & Chen, ICCV 2005

# Chromatic Aberration



Lens has different refractive indices for different wavelengths.

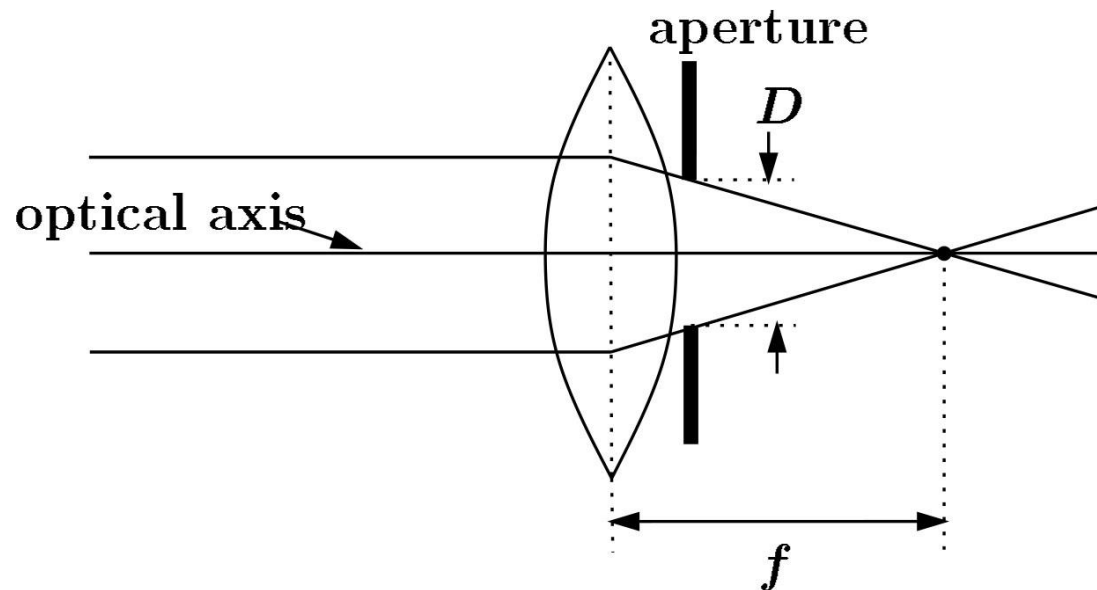


Special lens systems using two or more pieces of glass with different refractive indexes can reduce or eliminate this problem.



# Exposure

- **Exposure = aperture + shutter speed**
  - **Aperture** of diameter  $D$  restricts the range of rays (aperture may be on either side of the lens)
  - **Shutter speed** is the amount of time that light is allowed to pass through the aperture

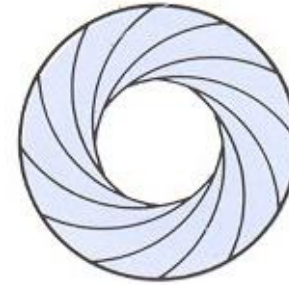


# Exposure (cont.)

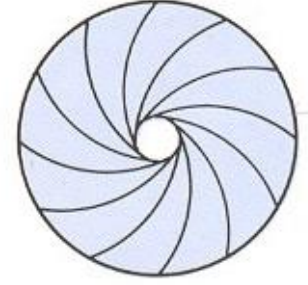
- Aperture (in f stop)



Full aperture



Medium aperture

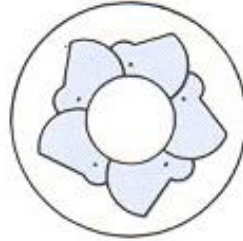


Stopped down

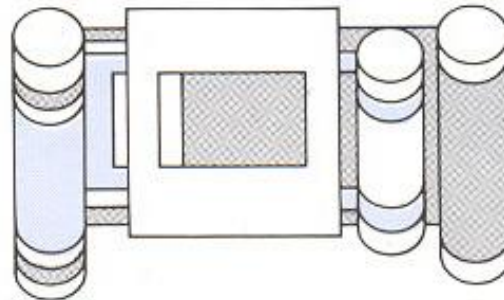
- Shutter speed (in fraction of a second)



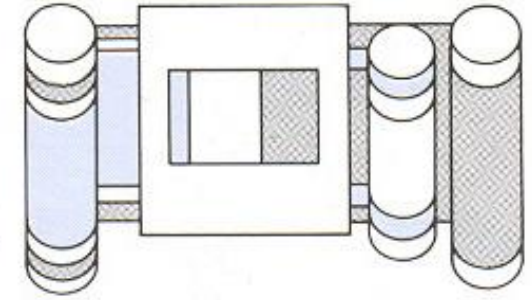
Blade (closing)



Blade (open)



Focal plane (closed)

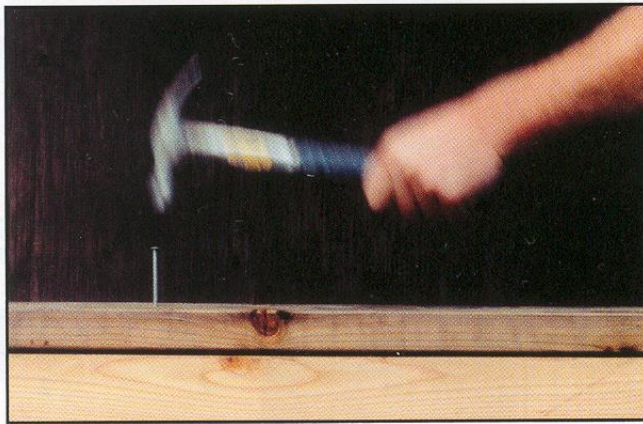


Focal plane (open)

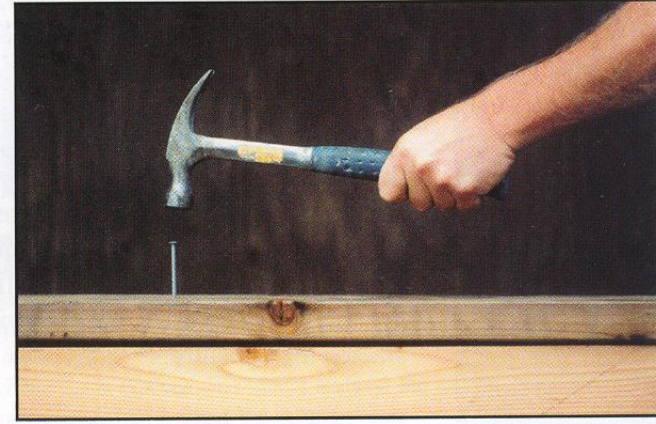
# Effect of Shutter Speeds

- Slow shutter speed → more light, but more motion blur

Slow shutter speed



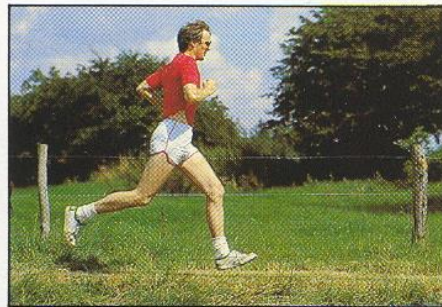
Fast shutter speed



- Faster shutter speed freezes motion



1/125



1/250



1/500



1/1000

# Effect of Shutter Speeds (cont.)

- Light trail



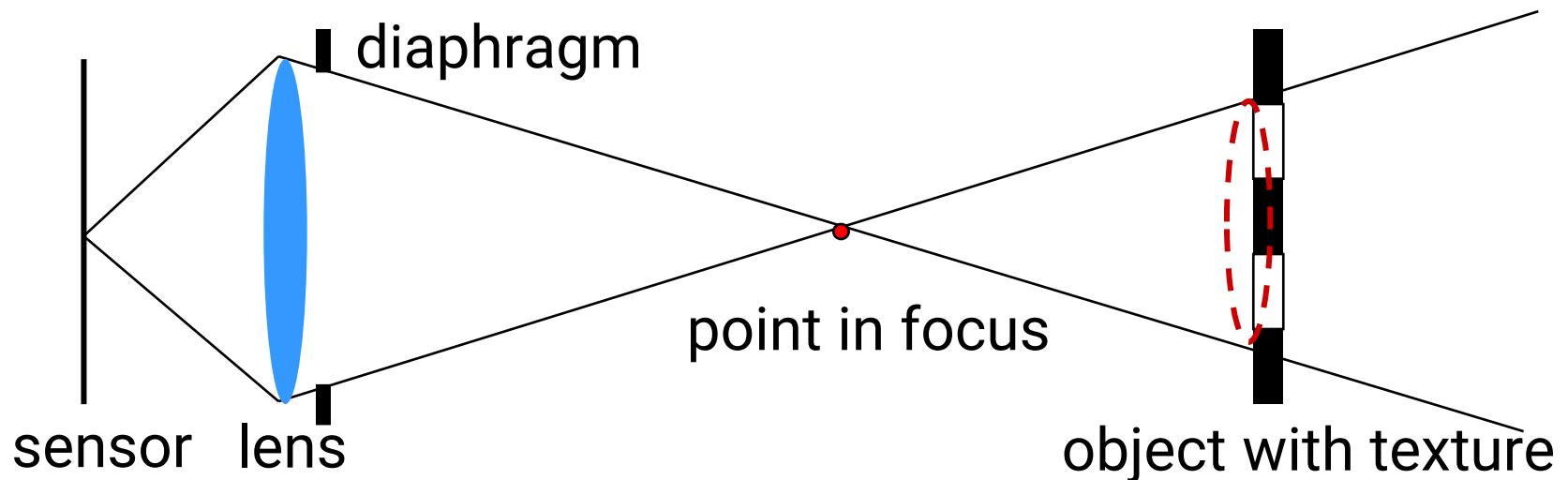
# Aperture

- Aperture is the diameter of the lens opening, usually specified by f-stop,  $f/D$ , a fraction of the focal length
- When a change in f-stop occurs, the light is either doubled or cut in half.
- Lower f-stop, more light (larger lens opening)
- Higher f-stop, less light (smaller lens opening)



# Depth of Field

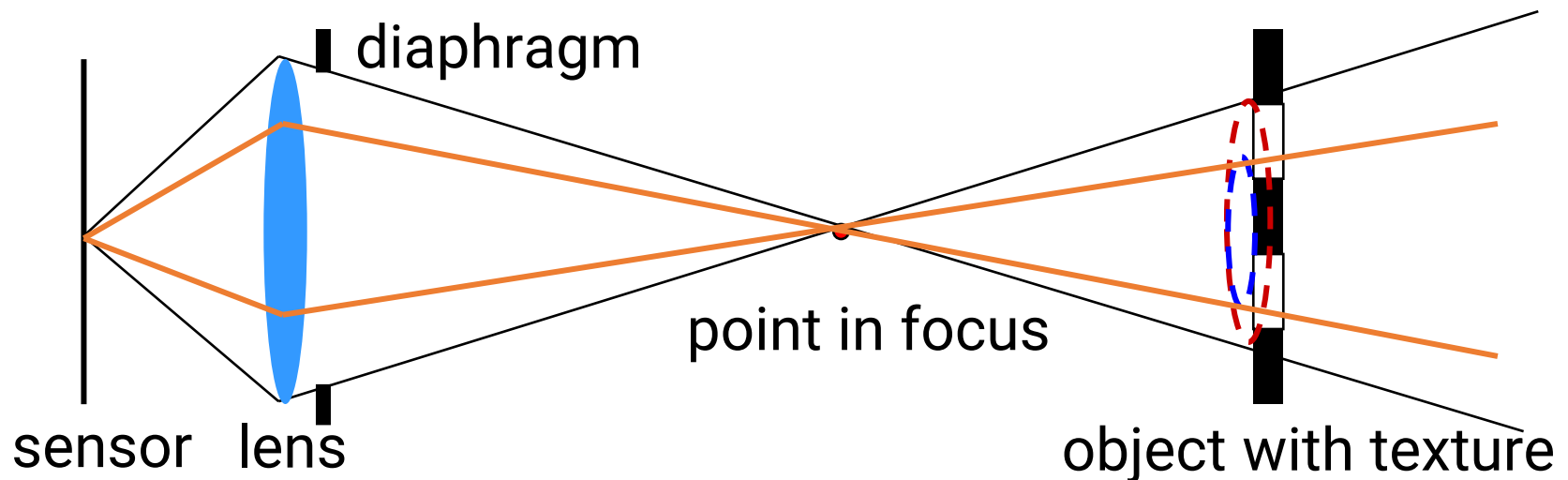
- Changing the aperture size affects **depth of field**
  - A smaller aperture increases the range in which the object is approximately in focus





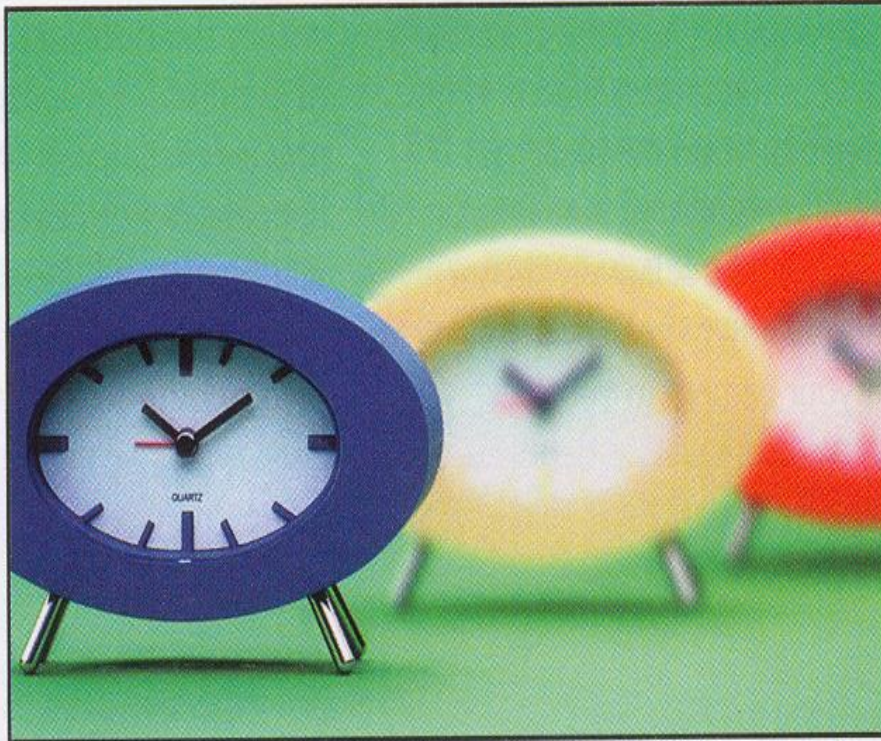
# Depth of Field (cont.)

- Changing the aperture size affects **depth of field**
  - A smaller aperture increases the range in which the object is approximately in focus



# Depth of Field (cont.)

LESS DEPTH OF FIELD

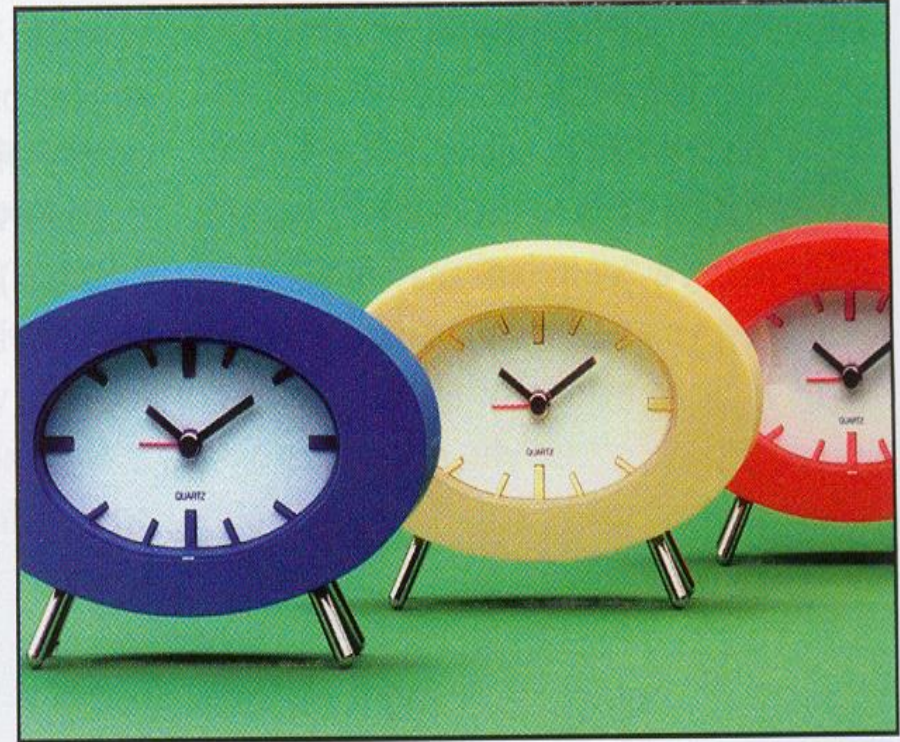


Wider aperture



f/2

MORE DEPTH OF FIELD



Smaller aperture



f/16

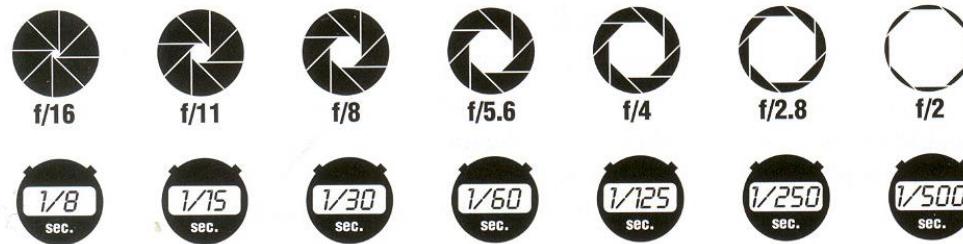
# Aperture and Shutter Speed

- The same exposure is obtained with an exposure twice as long and an aperture area half as big



# Aperture and Shutter Speed (cont.)

- Assume we know how much light we need
- We have the choice of an infinity of shutter speed/aperture pairs



- What will guide our choice of a shutter speed?
  - Freeze motion vs. motion blur, camera shake
- What will guide our choice of an aperture?
  - Depth of field, diffraction limit

# Exposure and Metering

- The camera metering system measures how bright the scene is
- In **aperture priority** mode, the photographer sets the aperture, the camera sets the shutter speed
- In **shutter-speed** priority mode, photographers sets the shutter speed and the camera deduces the aperture
- In **program mode**, the camera decides both exposure and shutter speed (middle value more or less)
- In **manual mode**, the user decides everything (but can get feedback)

# Exposure and Metering (cont.)

- **Aperture priority**

- Direct depth of field control
- Cons: can require impossible shutter speed (e.g. with f/1.4 for a bright scene)

- **Shutter speed priority**

- Direct motion blur control
- Cons: can require impossible aperture (e.g. when requesting a 1/1000 speed for a dark scene)

- **Program**

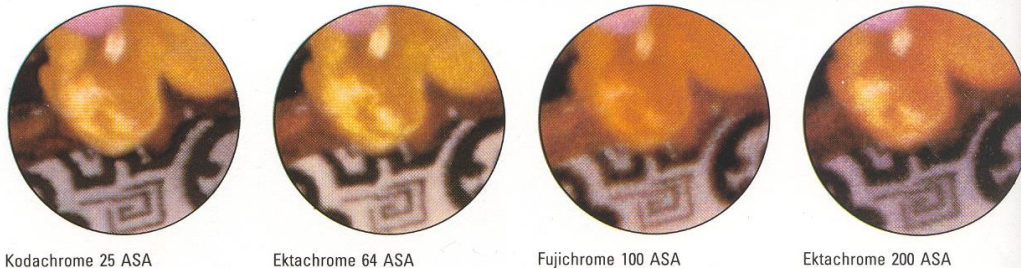
- Almost no control, but no need for neurons

- **Manual**

- Full control, but takes more time and thinking

# Sensitivity

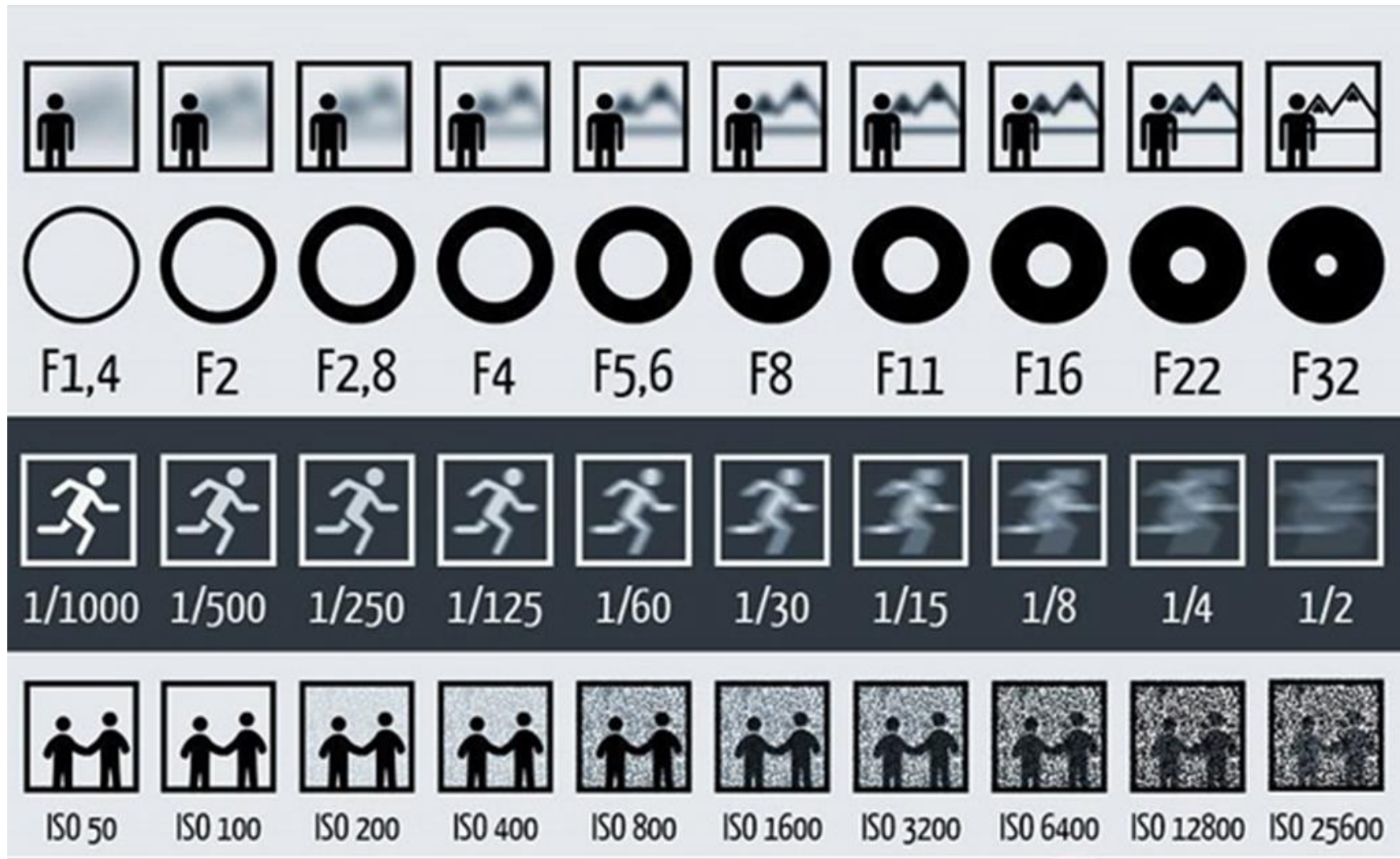
- Third variable for exposure
- Linear effect (200 ISO needs half the light as 100 ISO)
- Film photography: trade sensitivity for grain



- Digital photography: trade sensitivity for noise



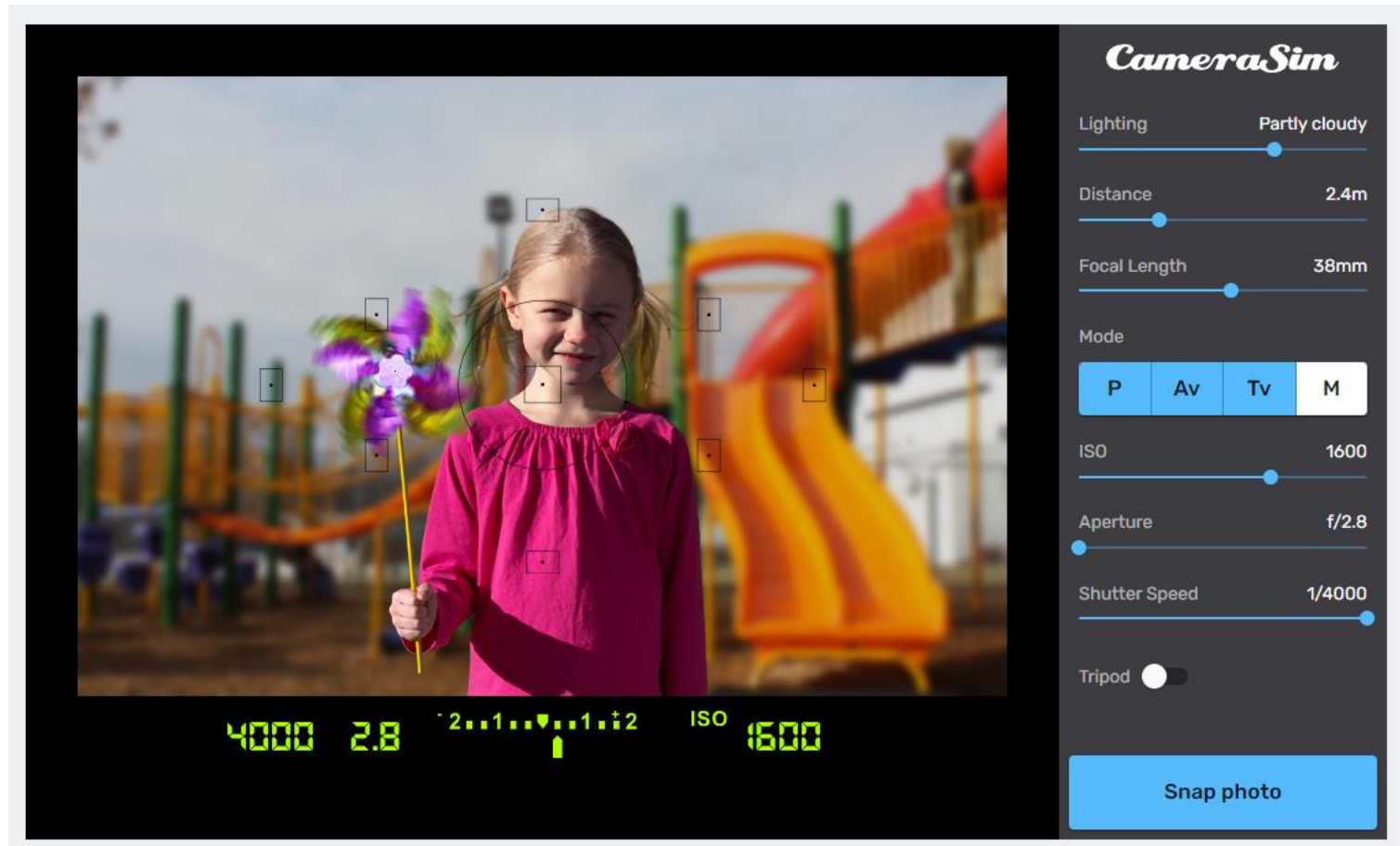
# Shutter Speed, Aperture, and Sensitivity





# Demo

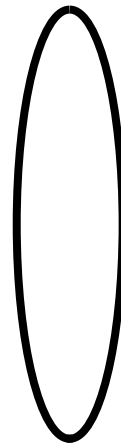
- <https://camerasim.com/camerasim-free-web-app/>



# Film Camera



scene



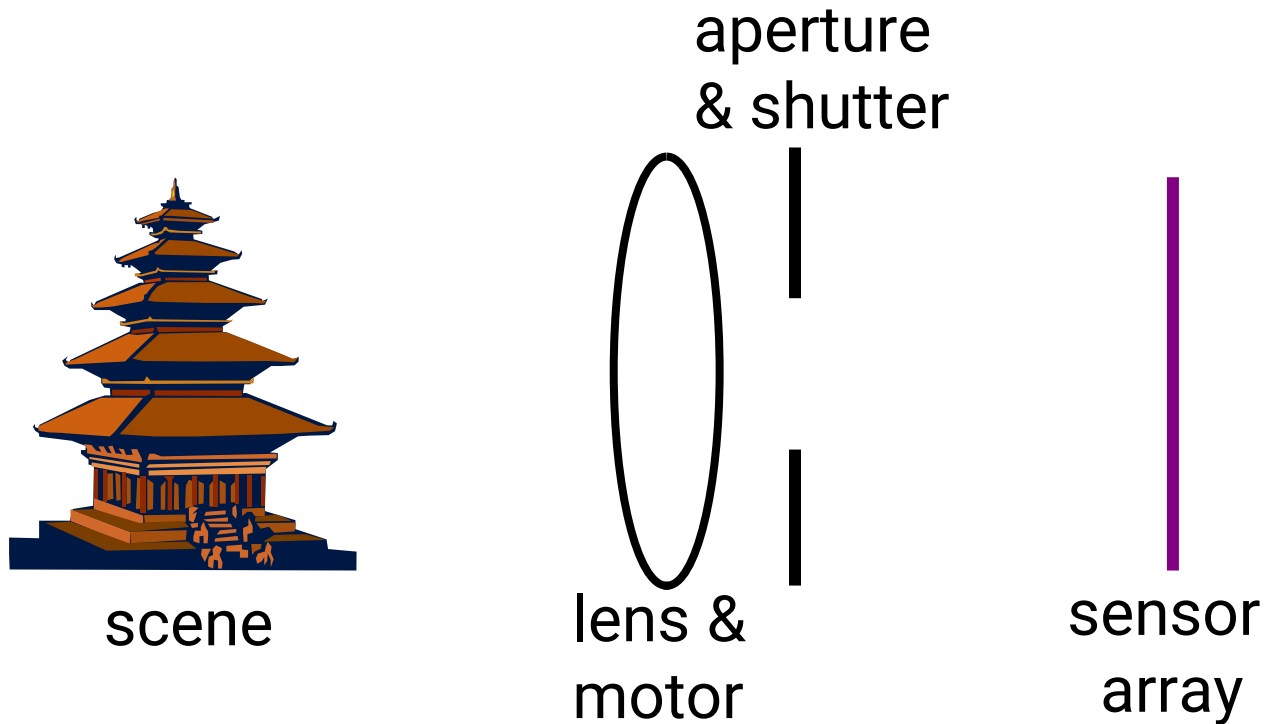
lens &  
motor

aperture  
& shutter



film

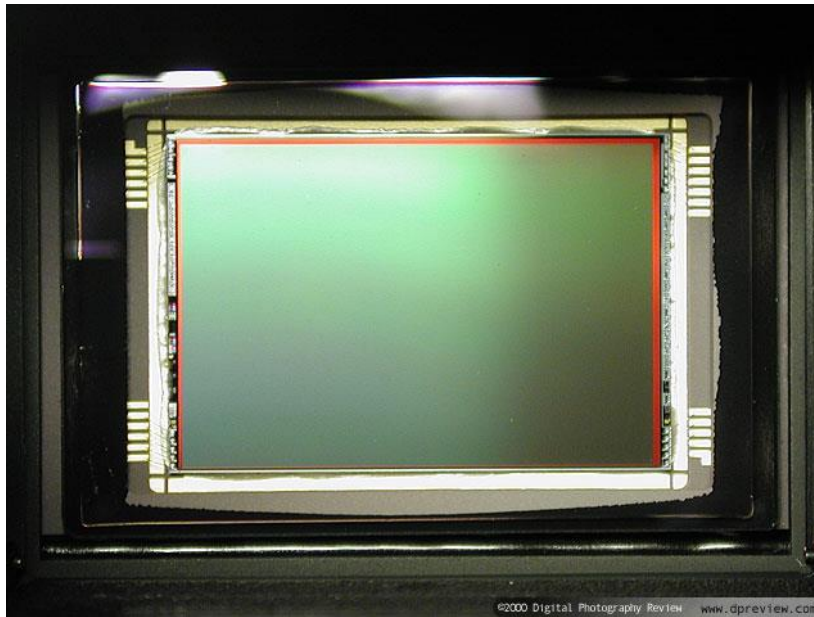
# Digital Camera



- A digital camera replaces film with a sensor array
- Each cell in the array is a light-sensitive diode that converts photons to electrons

# CCD v.s. CMOS

- CCD is less susceptible to noise (special process, higher fill factor)
- CMOS is more flexible, less expensive (standard process), less power consumption



CCD



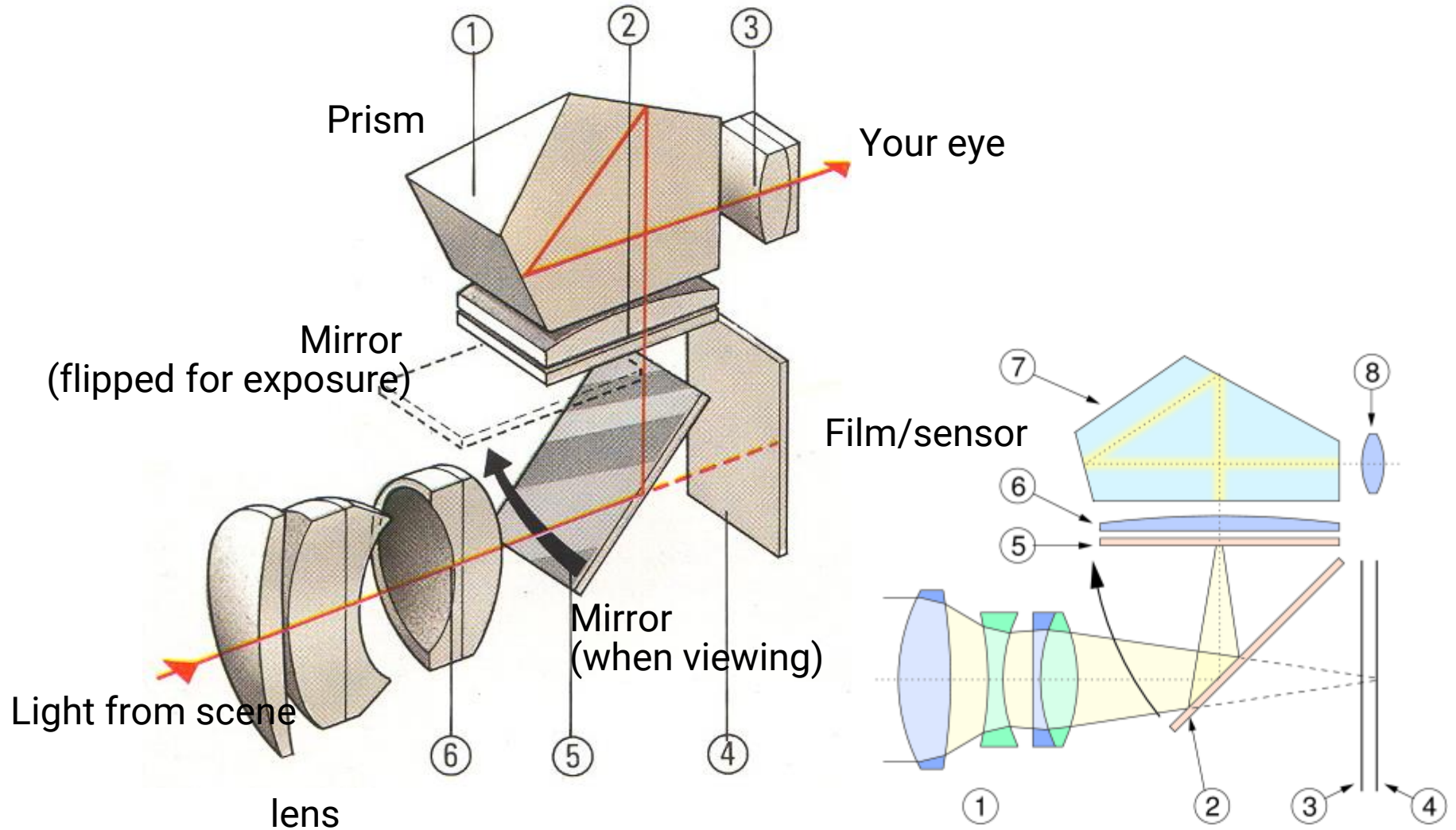
CMOS

# SLR (Single-Lens Reflex)

- Reflex (R in SLR) means that we see through the same lens used to take the image.
- Not the case for compact cameras



# SLR View Finder



# Color

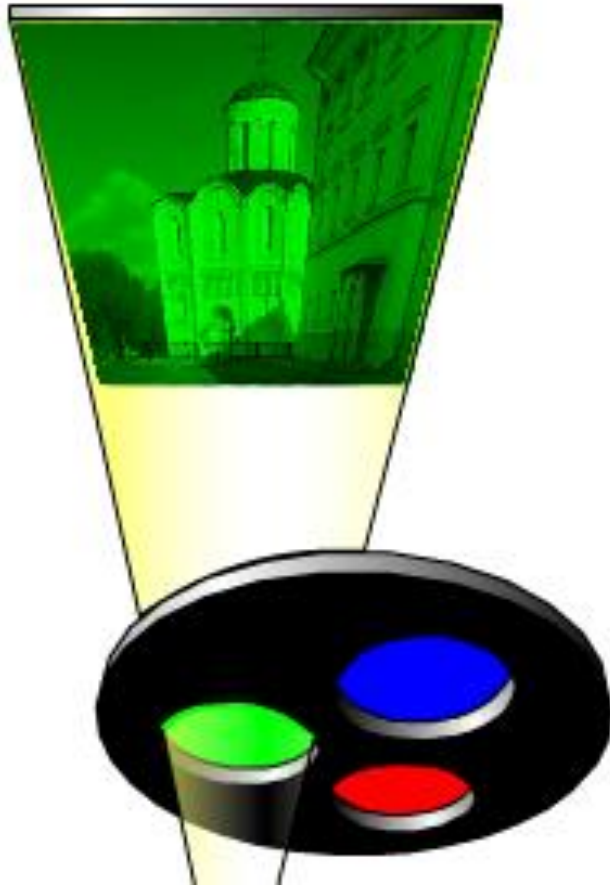
- So far, we've only talked about monochrome sensors. Color imaging has been implemented in a number of ways:
  - Field sequential
  - Multi-chip
  - Color filter array
  - X3 sensor

# Field Sequential

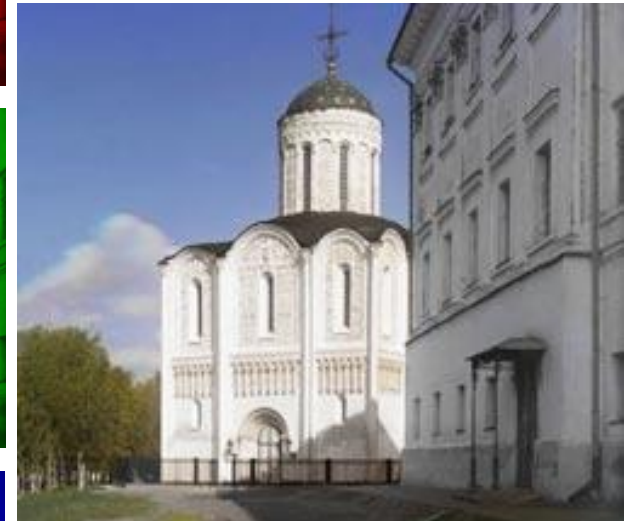
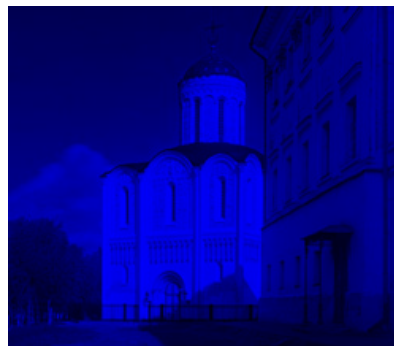
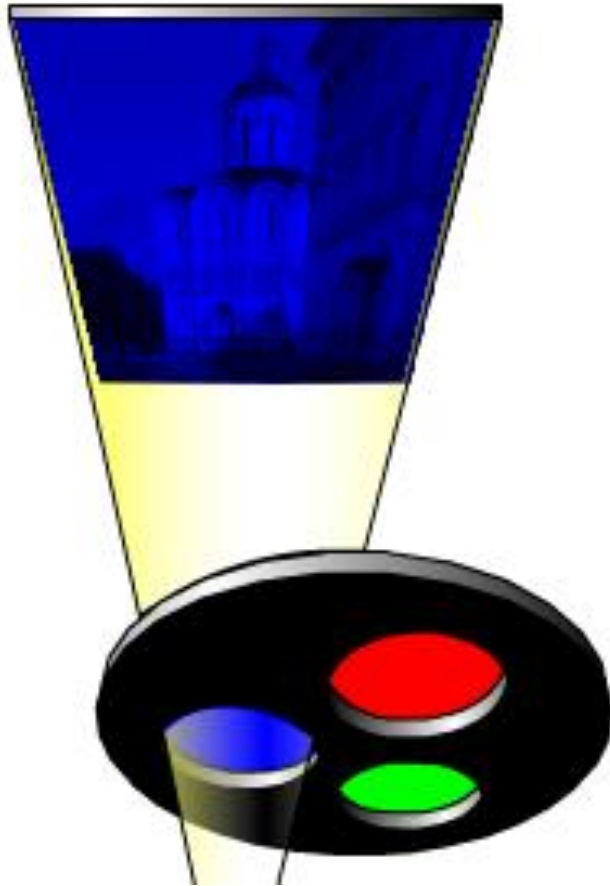




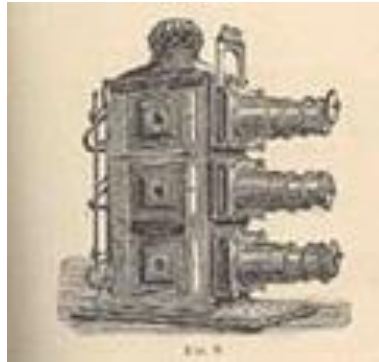
# Field Sequential (cont.)



# Field Sequential (cont.)



# Prokudin-Gorskii (early 1900's)



lantern  
projector

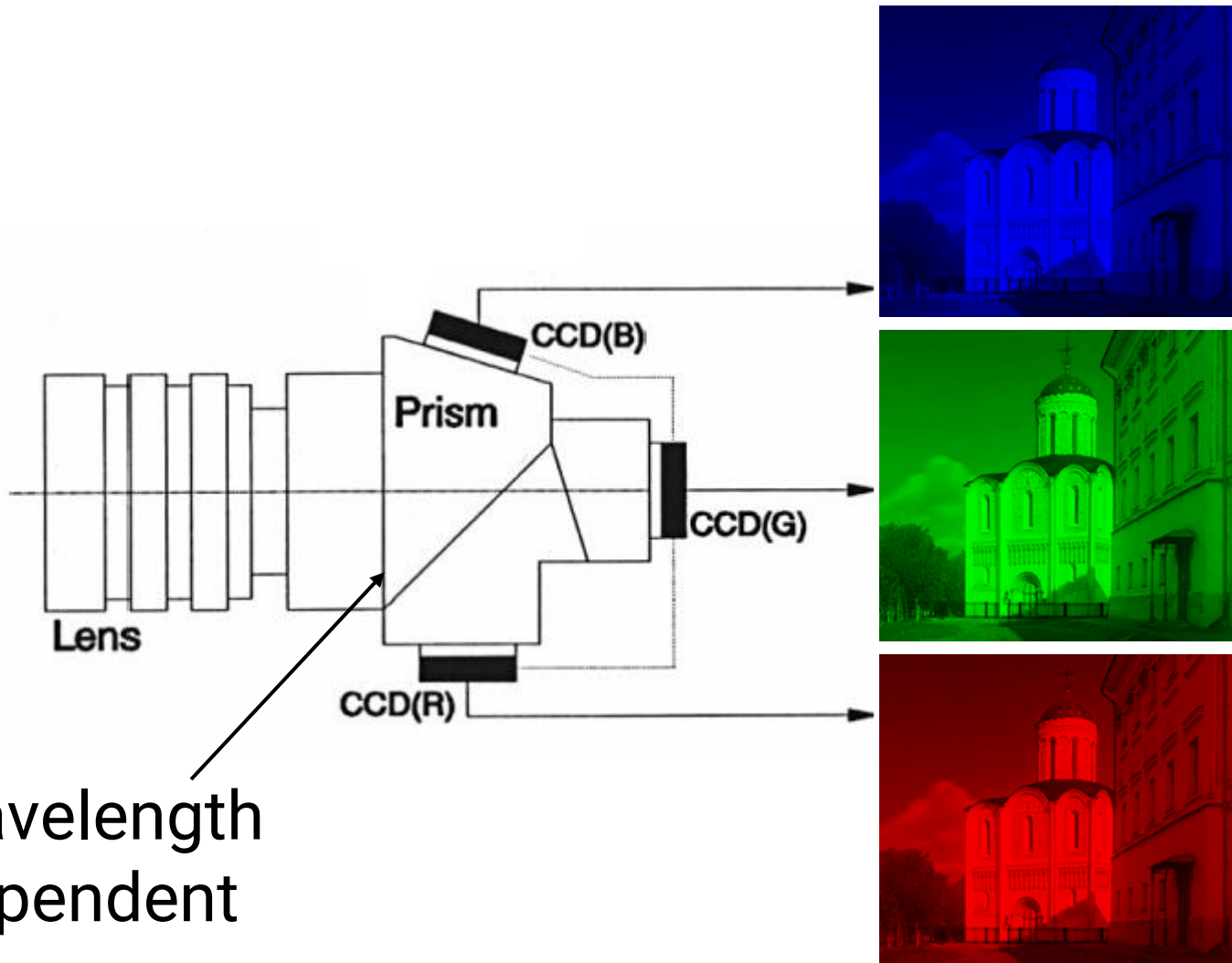


<http://www.loc.gov/exhibits/empire/>

# Prokudin-Gorskii (early 1900's)



# Multi-chip



# Color Filter Array

- Color filter arrays (CFAs) / color filter mosaics

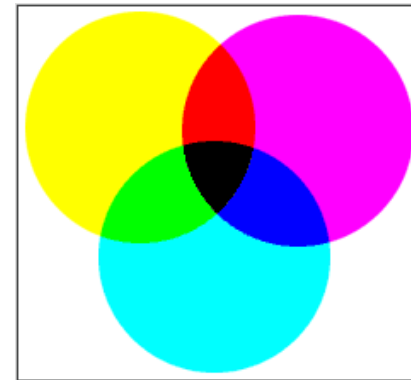
|   |   |   |
|---|---|---|
| R | G | B |
| R | G | B |
| R | G | B |
| R | G | B |

|   |   |   |   |
|---|---|---|---|
| R | G | B | G |
| R | G | B | G |
| R | G | B | G |
| R | G | B | G |

|    |   |    |   |
|----|---|----|---|
| Ye | G | Cy | G |
| Ye | G | Cy | G |
| Ye | G | Cy | G |
| Ye | G | Cy | G |

**Stripes**

Kodak DCS620x

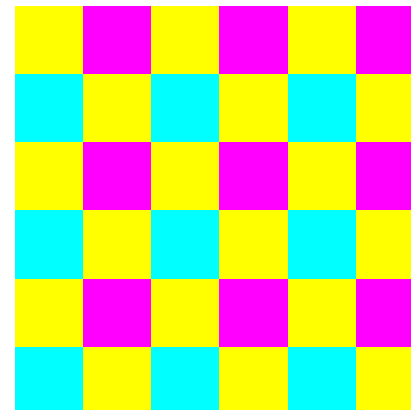


|    |   |    |   |
|----|---|----|---|
| Cy | W | Ye | G |
| Ye | G | Cy | W |
| Cy | W | Ye | G |
| Ye | G | Cy | W |

|    |    |    |    |
|----|----|----|----|
| G  | Mg | G  | Mg |
| Cy | Ye | Cy | Ye |
| Mg | G  | Mg | G  |
| Cy | Ye | Cy | Ye |

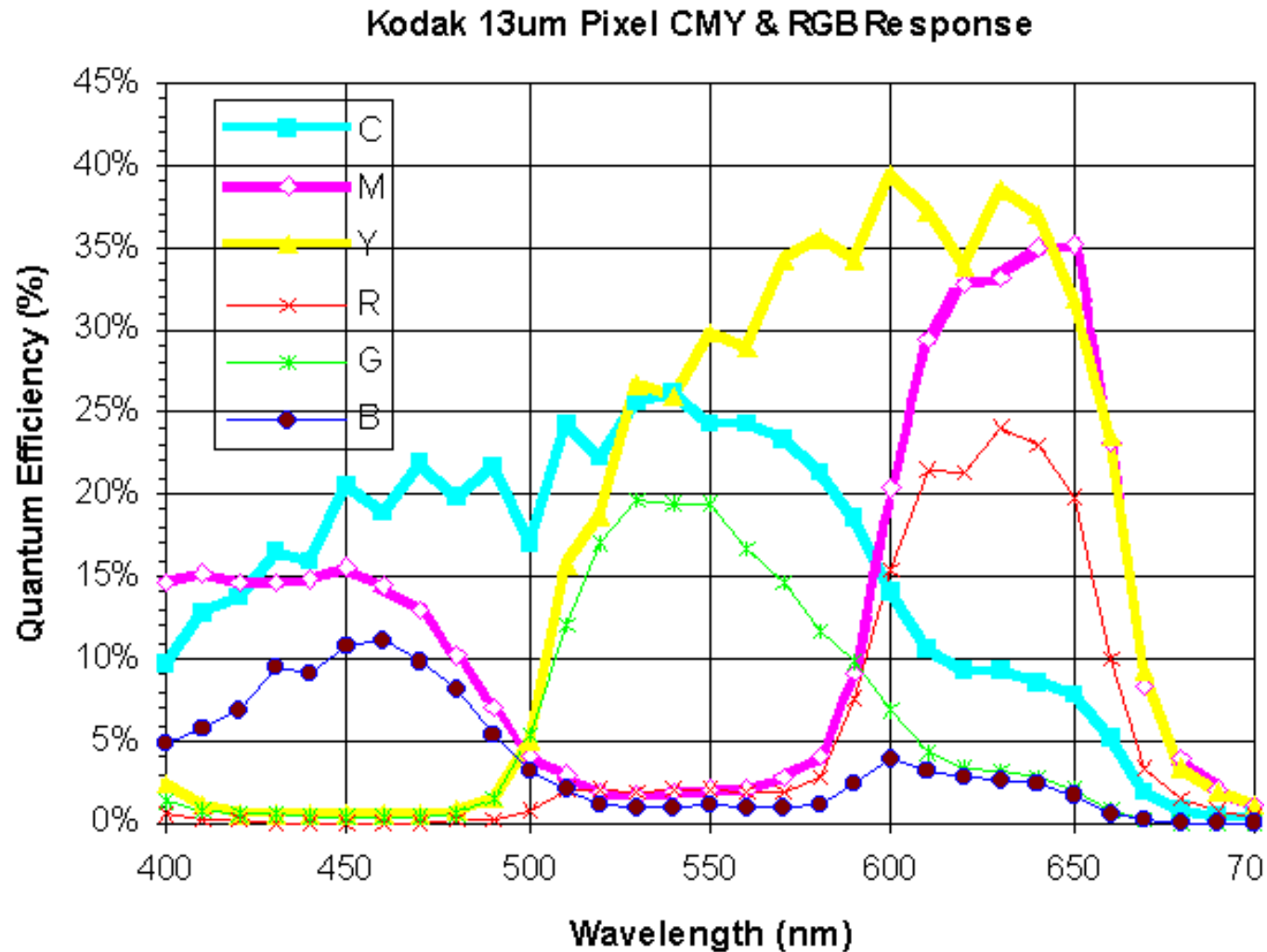
|   |   |   |   |
|---|---|---|---|
| R | G | R | G |
| G | B | G | B |
| R | G | R | G |
| G | B | G | B |

**Mosaics**



**CMY**

# CMY v.s. RGB CFA



# Color Filter Array (cont.)

- Color filter arrays (CFAs) / color filter mosaics

|   |   |   |
|---|---|---|
| R | G | B |
| R | G | B |
| R | G | B |
| R | G | B |

|   |   |   |   |
|---|---|---|---|
| R | G | B | G |
| R | G | B | G |
| R | G | B | G |
| R | G | B | G |

|    |   |    |   |
|----|---|----|---|
| Ye | G | Cy | G |
| Ye | G | Cy | G |
| Ye | G | Cy | G |
| Ye | G | Cy | G |

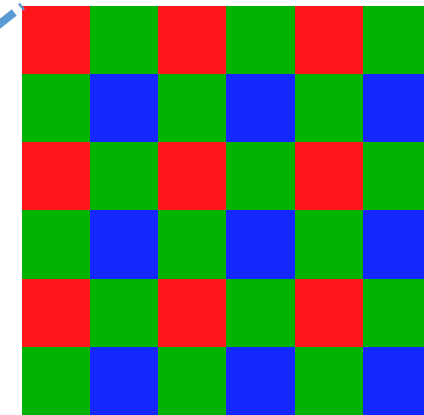
**Stripes**

|    |   |    |   |
|----|---|----|---|
| Cy | W | Ye | G |
| Ye | G | Cy | W |
| Cy | W | Ye | G |
| Ye | G | Cy | W |

|    |    |    |    |
|----|----|----|----|
| G  | Mg | G  | Mg |
| Cy | Ye | Cy | Ye |
| Mg | G  | Mg | G  |
| Cy | Ye | Cy | Ye |

|   |   |   |   |
|---|---|---|---|
| R | G | R | G |
| G | B | G | B |
| R | G | R | G |
| G | B | G | B |

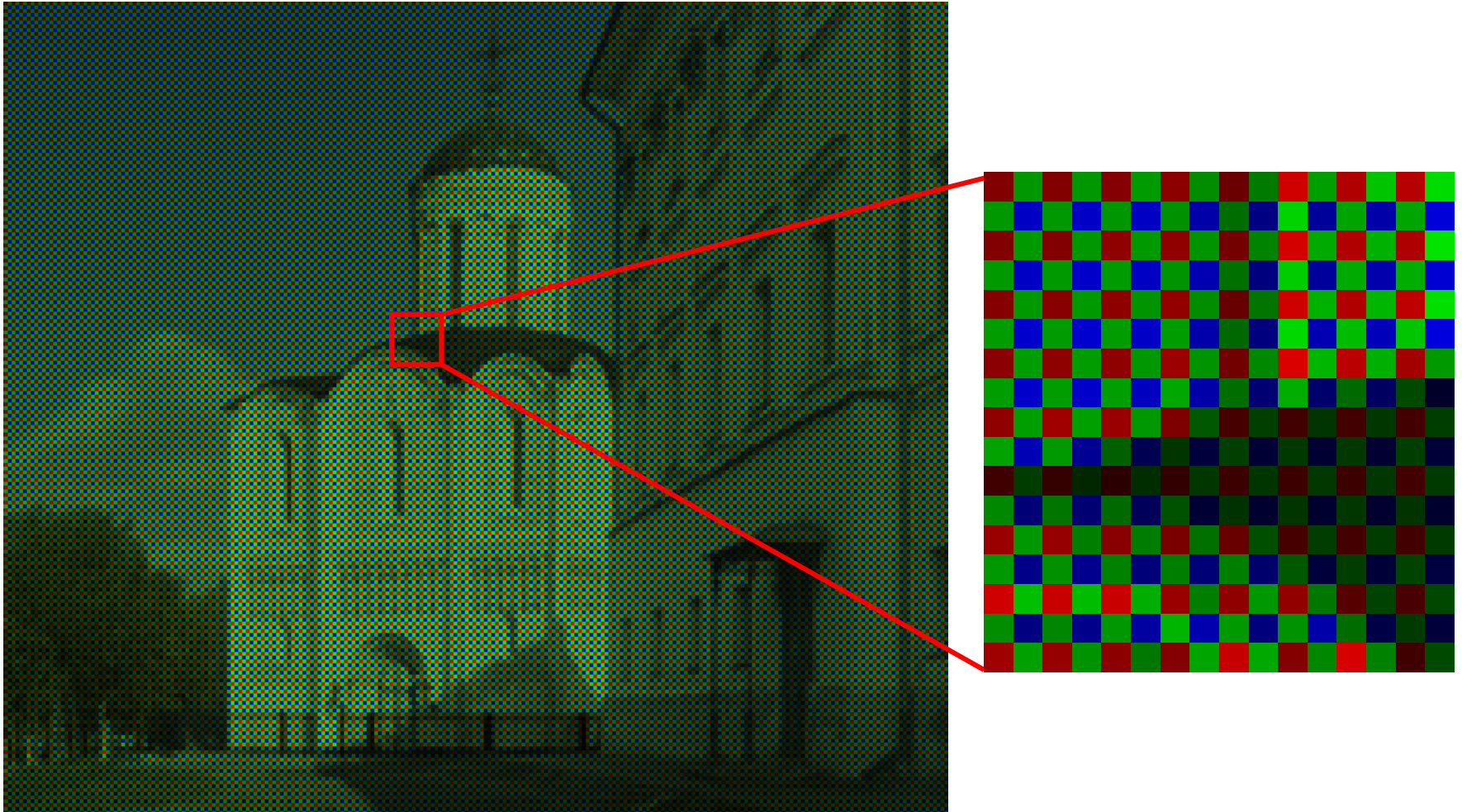
**Mosaics**



**Bayer pattern**



# Bayer's Pattern



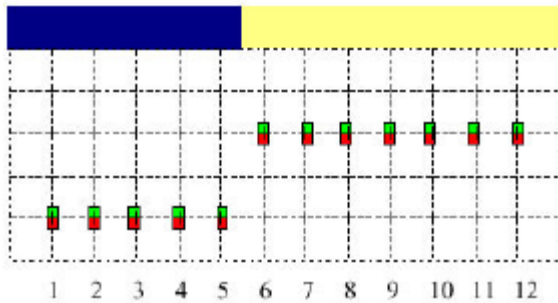
# Demosaicking CFA

|                 |                 |                 |                 |                 |                 |                 |
|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| R <sub>11</sub> | G <sub>12</sub> | R <sub>13</sub> | G <sub>14</sub> | R <sub>15</sub> | G <sub>16</sub> | R <sub>17</sub> |
| G <sub>21</sub> | B <sub>22</sub> | G <sub>23</sub> | B <sub>24</sub> | G <sub>25</sub> | B <sub>26</sub> | G <sub>27</sub> |
| R <sub>31</sub> | G <sub>32</sub> | R <sub>33</sub> | G <sub>34</sub> | R <sub>35</sub> | G <sub>36</sub> | R <sub>37</sub> |
| G <sub>41</sub> | B <sub>42</sub> | G <sub>43</sub> | B <sub>44</sub> | G <sub>45</sub> | B <sub>46</sub> | G <sub>47</sub> |
| R <sub>51</sub> | G <sub>52</sub> | R <sub>53</sub> | G <sub>54</sub> | R <sub>55</sub> | G <sub>56</sub> | R <sub>57</sub> |

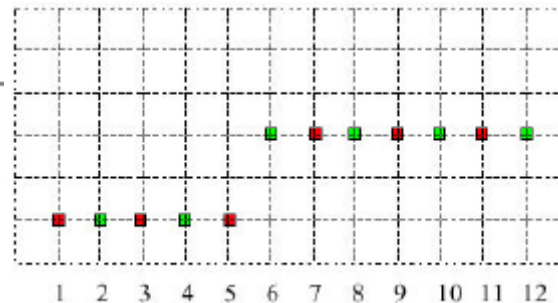
bilinear interpolation

$$G_{44} = (G_{34} + G_{43} + G_{45} + G_{54})/4$$

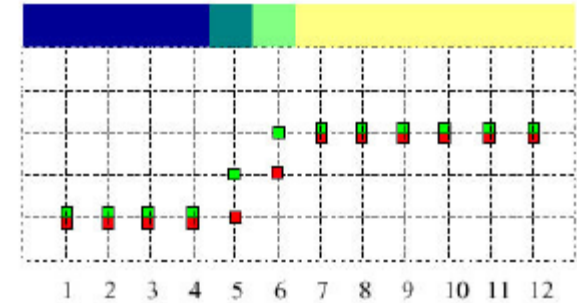
$$R_{44} = (R_{33} + R_{35} + R_{53} + R_{55})/4$$



original



input



linear interpolation

# Demosaicking CFA (cont.)

|                 |                 |                 |                 |                 |                 |                 |
|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| R <sub>11</sub> | G <sub>12</sub> | R <sub>13</sub> | G <sub>14</sub> | R <sub>15</sub> | G <sub>16</sub> | R <sub>17</sub> |
| G <sub>21</sub> | B <sub>22</sub> | G <sub>23</sub> | B <sub>24</sub> | G <sub>25</sub> | B <sub>26</sub> | G <sub>27</sub> |
| R <sub>31</sub> | G <sub>32</sub> | R <sub>33</sub> | G <sub>34</sub> | R <sub>35</sub> | G <sub>36</sub> | R <sub>37</sub> |
| G <sub>41</sub> | B <sub>42</sub> | G <sub>43</sub> | B <sub>44</sub> | G <sub>45</sub> | B <sub>46</sub> | G <sub>47</sub> |
| R <sub>51</sub> | G <sub>52</sub> | R <sub>53</sub> | G <sub>54</sub> | R <sub>55</sub> | G <sub>56</sub> | R <sub>57</sub> |
| G <sub>61</sub> | B <sub>62</sub> | G <sub>63</sub> | B <sub>64</sub> | G <sub>65</sub> | B <sub>66</sub> | G <sub>67</sub> |
| R <sub>71</sub> | G <sub>72</sub> | R <sub>73</sub> | G <sub>74</sub> | R <sub>75</sub> | G <sub>76</sub> | R <sub>77</sub> |

Constant hue-based interpolation (Cok)

Hue:  $(R/G, B/G)$

Interpolate G first

$$R_{44} = G_{44} \frac{\frac{R_{33}}{G_{33}} + \frac{R_{35}}{G_{35}} + \frac{R_{53}}{G_{53}} + \frac{R_{55}}{G_{55}}}{4}$$

$$B_{33} = G_{33} \frac{\frac{B_{22}}{G_{22}} + \frac{B_{24}}{G_{24}} + \frac{B_{42}}{G_{42}} + \frac{B_{44}}{G_{44}}}{4}$$

# Demosaicking CFA (cont.)

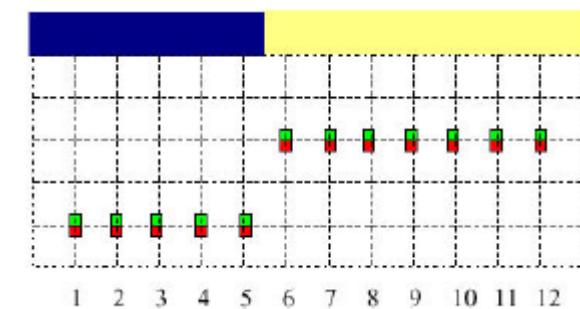
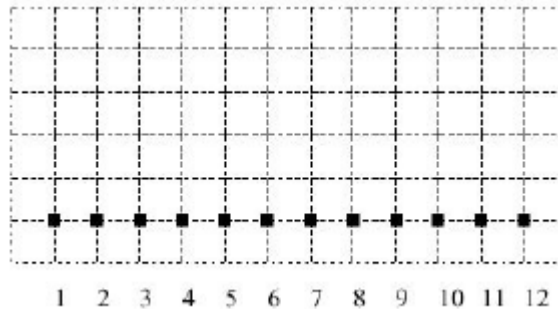
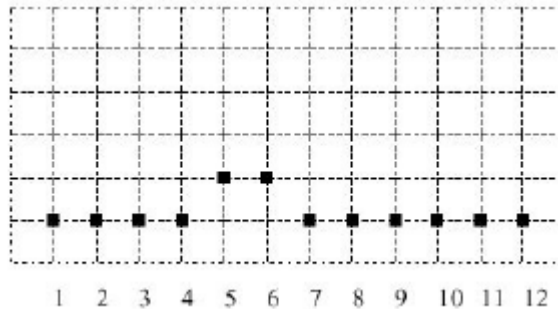
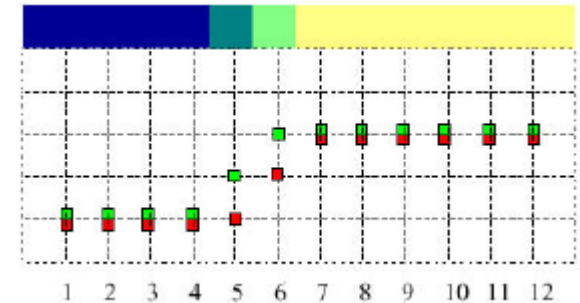
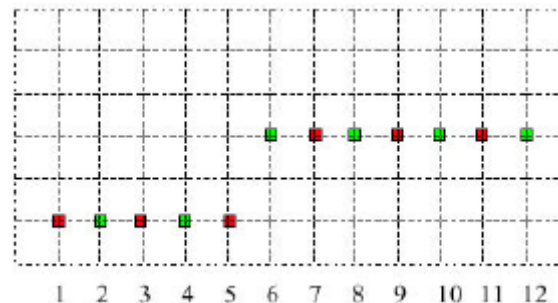
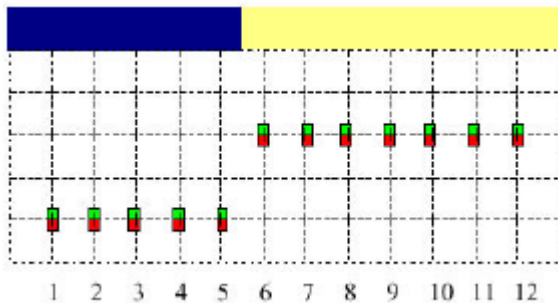
|                 |                 |                 |                 |                 |                 |                 |
|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| R <sub>11</sub> | G <sub>12</sub> | R <sub>13</sub> | G <sub>14</sub> | R <sub>15</sub> | G <sub>16</sub> | R <sub>17</sub> |
| G <sub>21</sub> | B <sub>22</sub> | G <sub>23</sub> | B <sub>24</sub> | G <sub>25</sub> | B <sub>26</sub> | G <sub>27</sub> |
| R <sub>31</sub> | G <sub>32</sub> | R <sub>33</sub> | G <sub>34</sub> | R <sub>35</sub> | G <sub>36</sub> | R <sub>37</sub> |
| G <sub>41</sub> | B <sub>42</sub> | G <sub>43</sub> | B <sub>44</sub> | G <sub>45</sub> | B <sub>46</sub> | G <sub>47</sub> |
| R <sub>51</sub> | G <sub>52</sub> | R <sub>53</sub> | G <sub>54</sub> | R <sub>55</sub> | G <sub>56</sub> | R <sub>57</sub> |
| G <sub>61</sub> | B <sub>62</sub> | G <sub>63</sub> | B <sub>64</sub> | G <sub>65</sub> | B <sub>66</sub> | G <sub>67</sub> |
| R <sub>71</sub> | G <sub>72</sub> | R <sub>73</sub> | G <sub>74</sub> | R <sub>75</sub> | G <sub>76</sub> | R <sub>77</sub> |

Median-based interpolation  
(Freeman)

1. Linear interpolation
2. Median filter on color differences

# Demosaicking CFA (cont.)

- Median-based interpolation (Freeman)



# Demosaicking CFA (cont.)

|                 |                 |                 |                 |                 |                 |                 |
|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| R <sub>11</sub> | G <sub>12</sub> | R <sub>13</sub> | G <sub>14</sub> | R <sub>15</sub> | G <sub>16</sub> | R <sub>17</sub> |
| G <sub>21</sub> | B <sub>22</sub> | G <sub>23</sub> | B <sub>24</sub> | G <sub>25</sub> | B <sub>26</sub> | G <sub>27</sub> |
| R <sub>31</sub> | G <sub>32</sub> | R <sub>33</sub> | G <sub>34</sub> | R <sub>35</sub> | G <sub>36</sub> | R <sub>37</sub> |
| B <sub>41</sub> | B <sub>42</sub> | G <sub>43</sub> | B <sub>44</sub> | G <sub>45</sub> | B <sub>46</sub> | B <sub>47</sub> |
| R <sub>51</sub> | G <sub>52</sub> | R <sub>53</sub> | G <sub>54</sub> | R <sub>55</sub> | G <sub>56</sub> | R <sub>57</sub> |
| G <sub>61</sub> | B <sub>62</sub> | G <sub>63</sub> | B <sub>64</sub> | G <sub>65</sub> | B <sub>66</sub> | G <sub>67</sub> |
| R <sub>71</sub> | G <sub>72</sub> | R <sub>73</sub> | G <sub>74</sub> | R <sub>75</sub> | G <sub>76</sub> | R <sub>77</sub> |

Gradient-based interpolation  
(LaRoche-Prescott)

1. Interpolation on G

$$\alpha = \text{abs}[(B_{42} + B_{46})/2 - B_{44}]$$

$$\beta = \text{abs}[(B_{24} + B_{64})/2 - B_{44}]$$

$$G_{44} = \begin{cases} \frac{G_{43} + G_{45}}{2} & \text{if } \alpha < \beta \\ \frac{G_{34} + G_{54}}{2} & \text{if } \alpha > \beta \\ \frac{G_{43} + G_{45} + G_{34} + G_{54}}{4} & \text{if } \alpha = \beta \end{cases}$$

# Demosaicking CFA (cont.)

|                 |                 |                 |                 |                 |                 |                 |
|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| R <sub>11</sub> | G <sub>12</sub> | R <sub>13</sub> | G <sub>14</sub> | R <sub>15</sub> | G <sub>16</sub> | R <sub>17</sub> |
| G <sub>21</sub> | B <sub>22</sub> | G <sub>23</sub> | B <sub>24</sub> | G <sub>25</sub> | B <sub>26</sub> | G <sub>27</sub> |
| R <sub>31</sub> | G <sub>32</sub> | R <sub>33</sub> | G <sub>34</sub> | R <sub>35</sub> | G <sub>36</sub> | R <sub>37</sub> |
| G <sub>41</sub> | B <sub>42</sub> | G <sub>43</sub> | B <sub>44</sub> | G <sub>45</sub> | B <sub>46</sub> | G <sub>47</sub> |
| R <sub>51</sub> | G <sub>52</sub> | R <sub>53</sub> | G <sub>54</sub> | R <sub>55</sub> | G <sub>56</sub> | R <sub>57</sub> |
| G <sub>61</sub> | B <sub>62</sub> | G <sub>63</sub> | B <sub>64</sub> | G <sub>65</sub> | B <sub>66</sub> | G <sub>67</sub> |
| R <sub>71</sub> | G <sub>72</sub> | R <sub>73</sub> | G <sub>74</sub> | R <sub>75</sub> | G <sub>76</sub> | R <sub>77</sub> |

Gradient-based interpolation  
(LaRoche-Prescott)

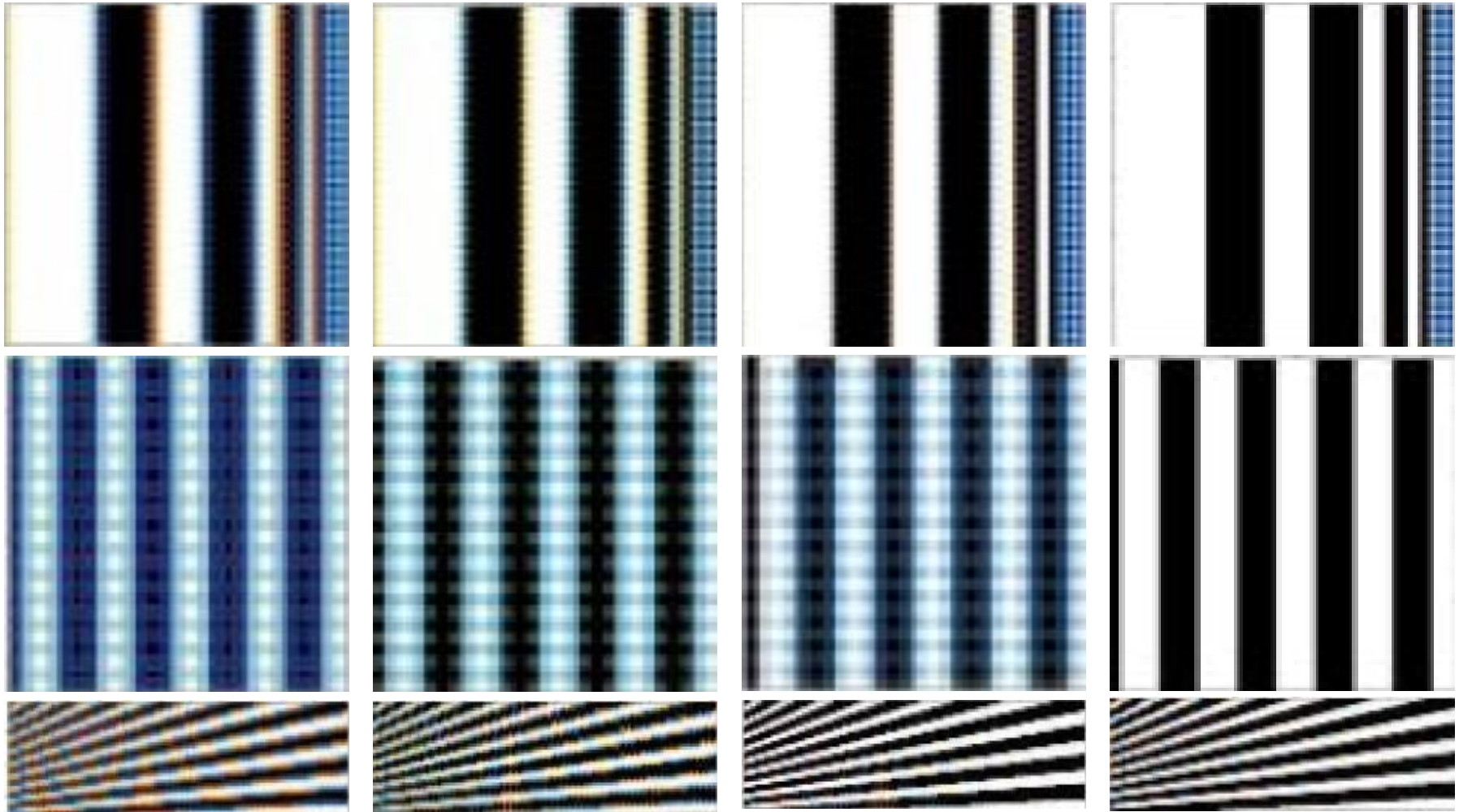
2. Interpolation of color differences

$$R_{34} = \frac{(R_{33} - G_{33}) + (R_{35} - G_{35})}{2} + G_{34},$$

$$R_{43} = \frac{(R_{33} - G_{33}) + (R_{35} - G_{35})}{2} + G_{43},$$

$$R_{44} = \frac{(R_{33} - G_{33}) + (R_{35} - G_{35}) + (R_{53} - G_{53}) + (R_{55} - G_{55})}{4} + G_{44}.$$

# Demosaicking CFA (cont.)



bilinear

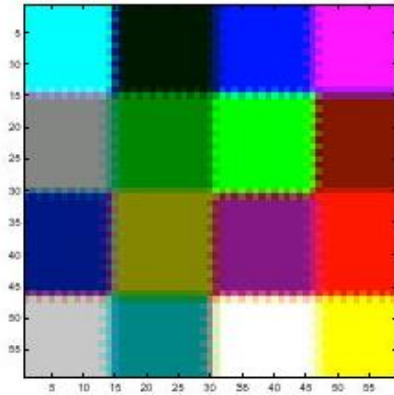
Cok

Freeman

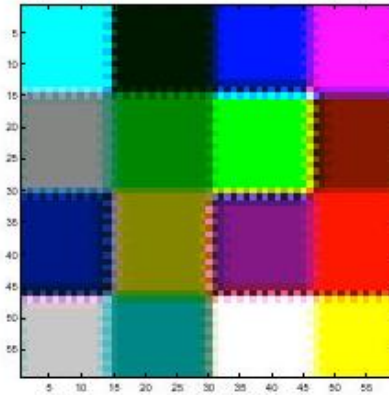
LaRoche



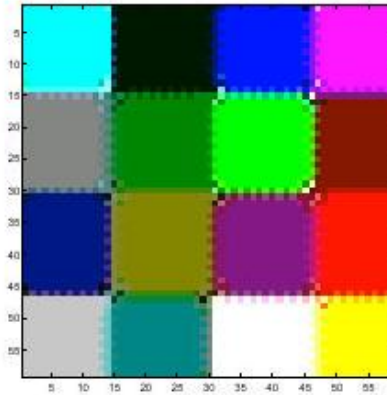
# Demosaicking CFA (cont.)



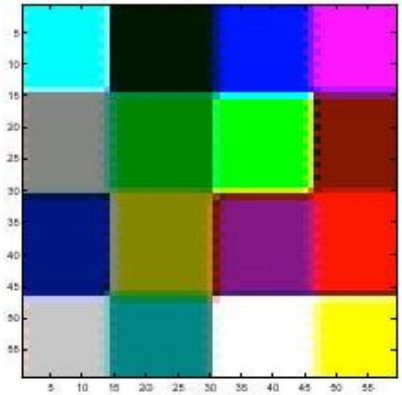
*Bilinear*



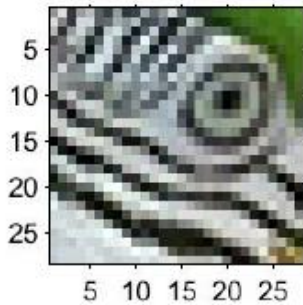
*Cok*



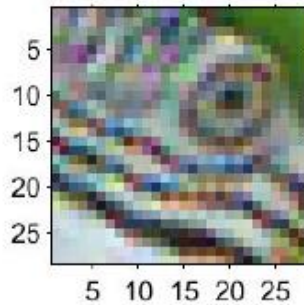
*Freeman*



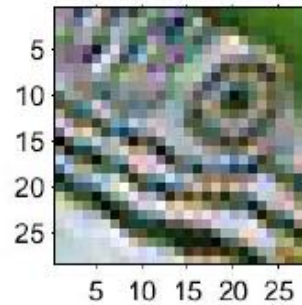
*LaRoche*



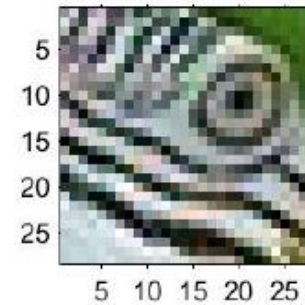
*Input*



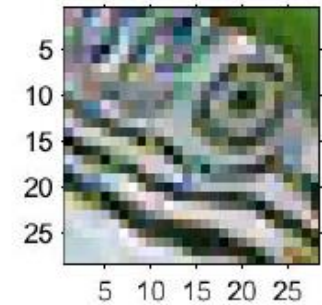
*Bilinear*



*Cok*



*Freeman*

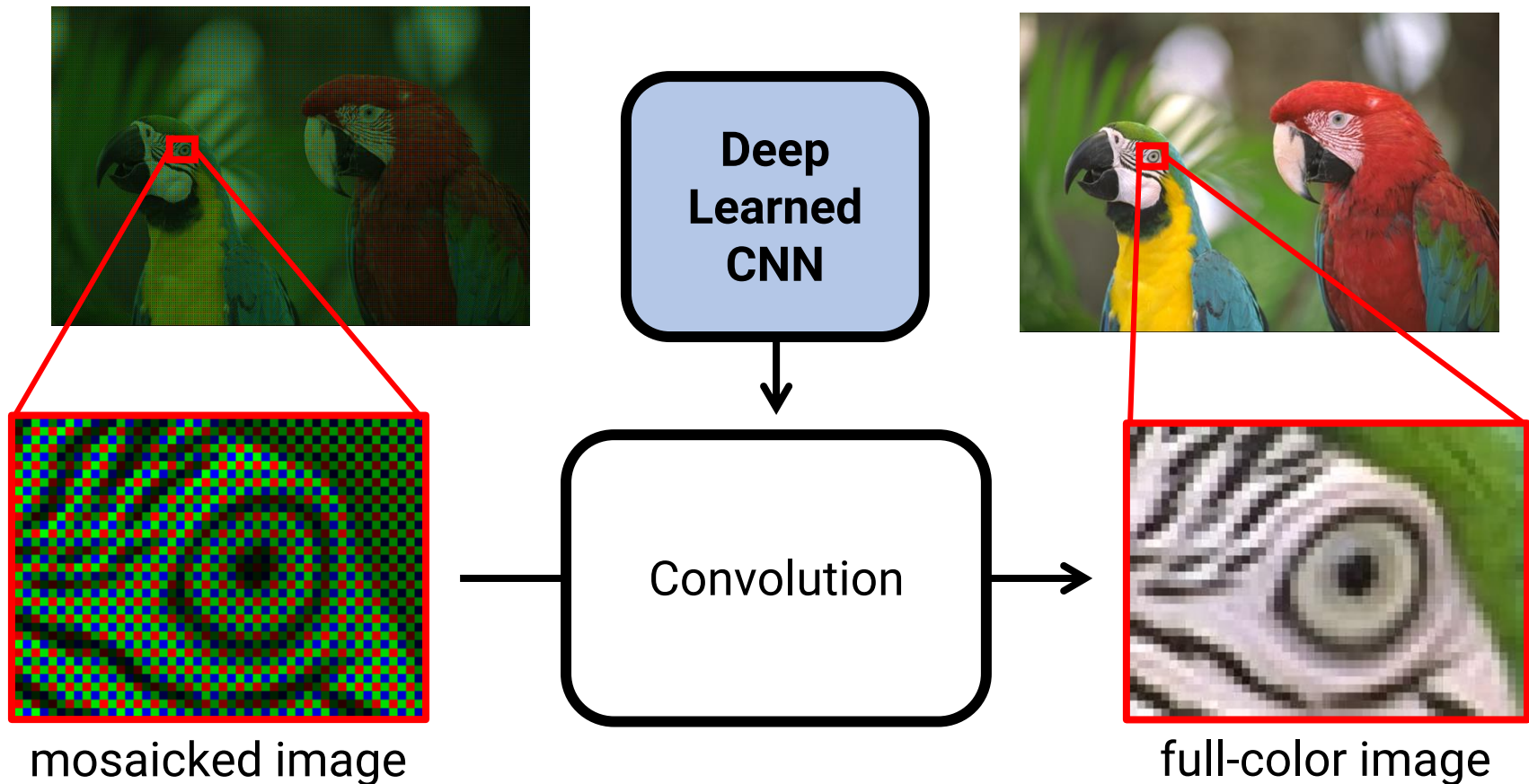


*LaRoche*

Generally, Freeman's is the best, especially for natural images

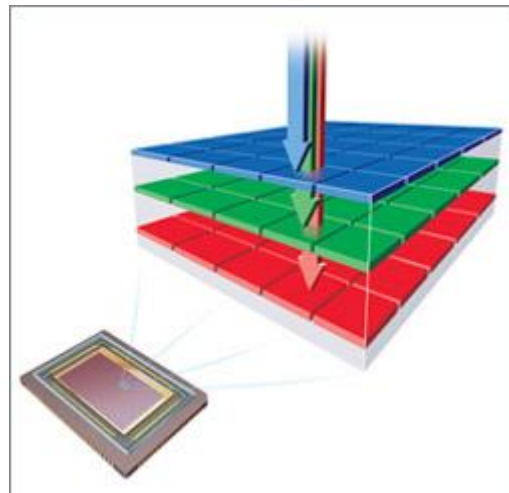
# Demosaicking CFA (cont.)

- Deep learning approach

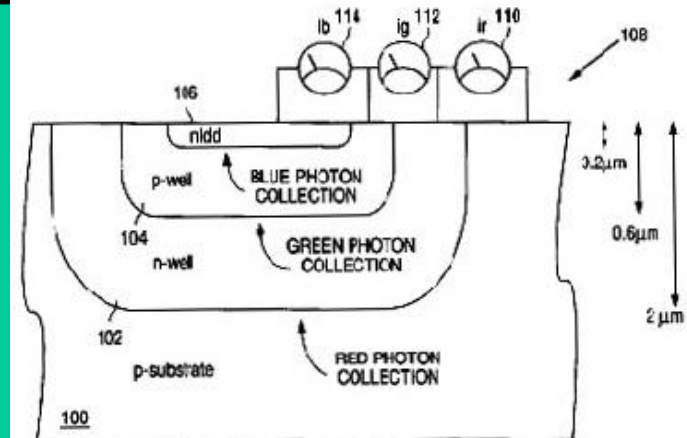
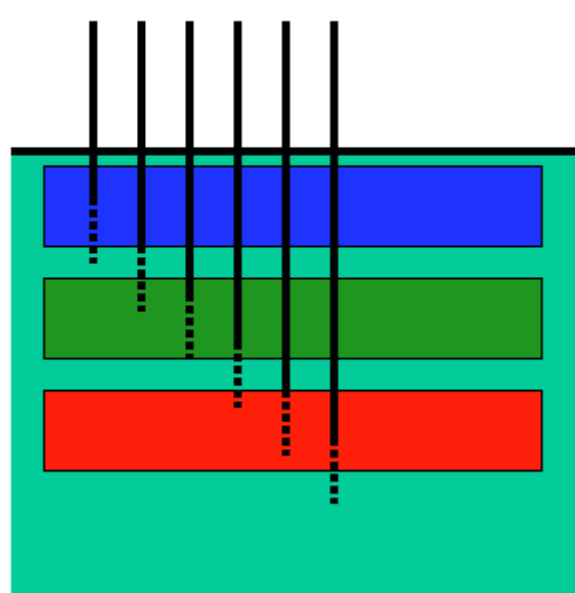


# Foveon X3 sensor

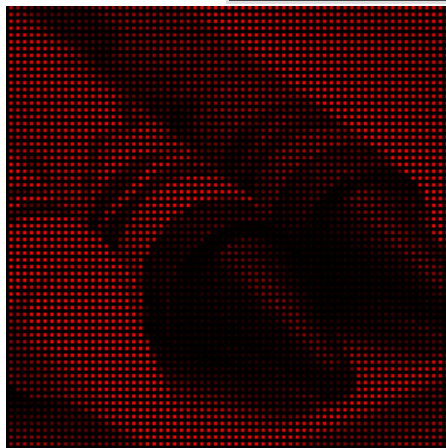
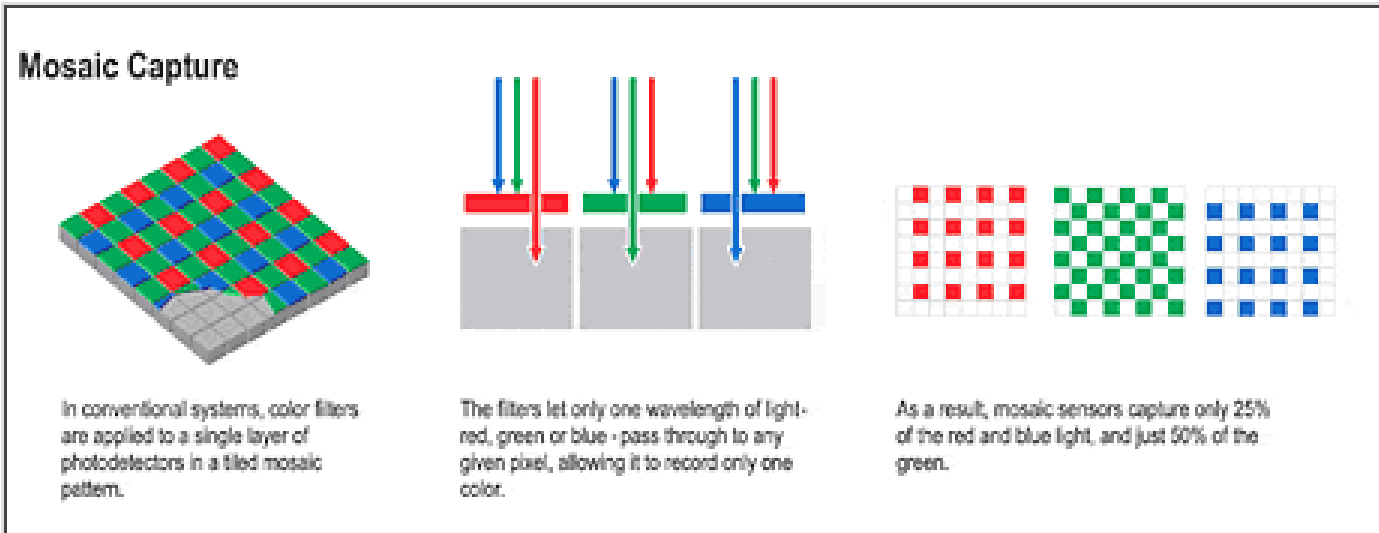
- light penetrates to different depths for different wavelengths
- Multilayer CMOS sensor gets 3 different spectral sensitivities



400                      700



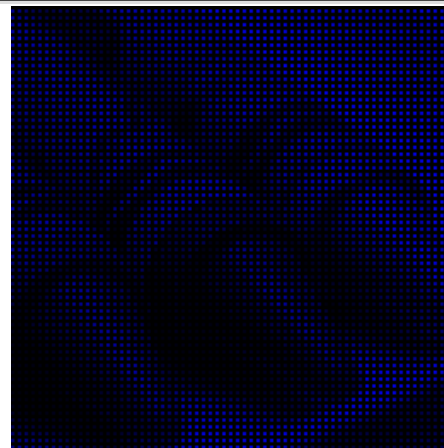
# X3 Technology



red



green

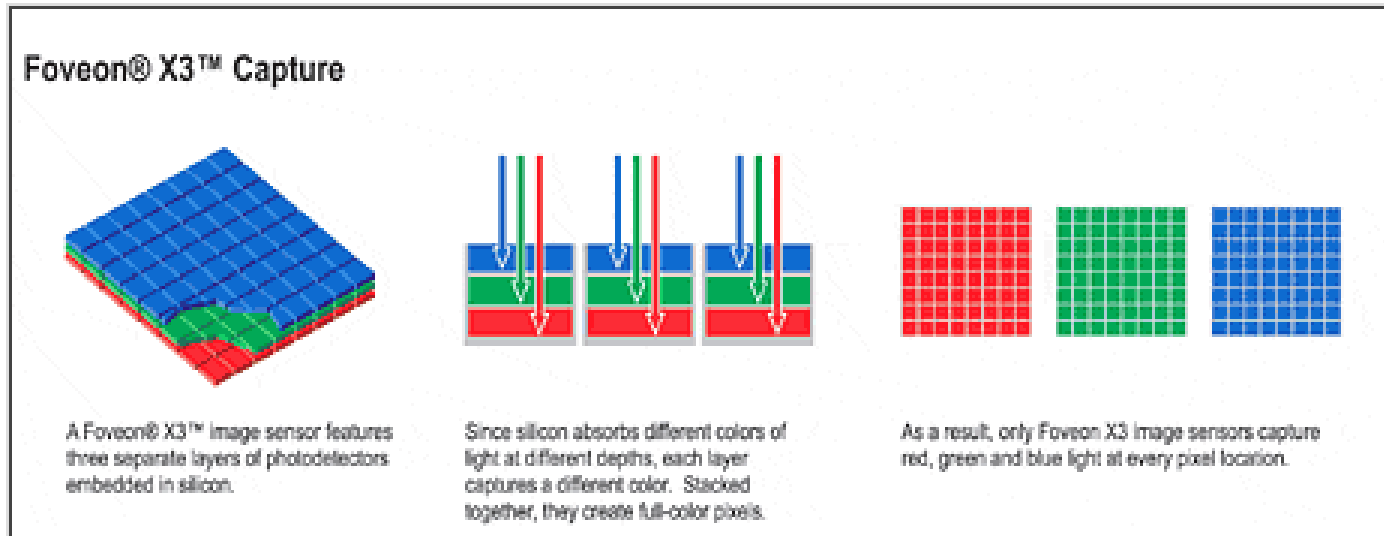


blue



output

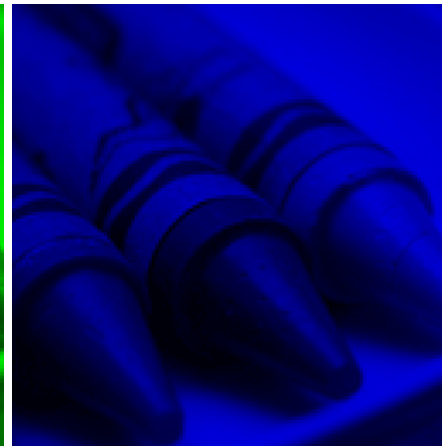
# Color Filter Array



red



green

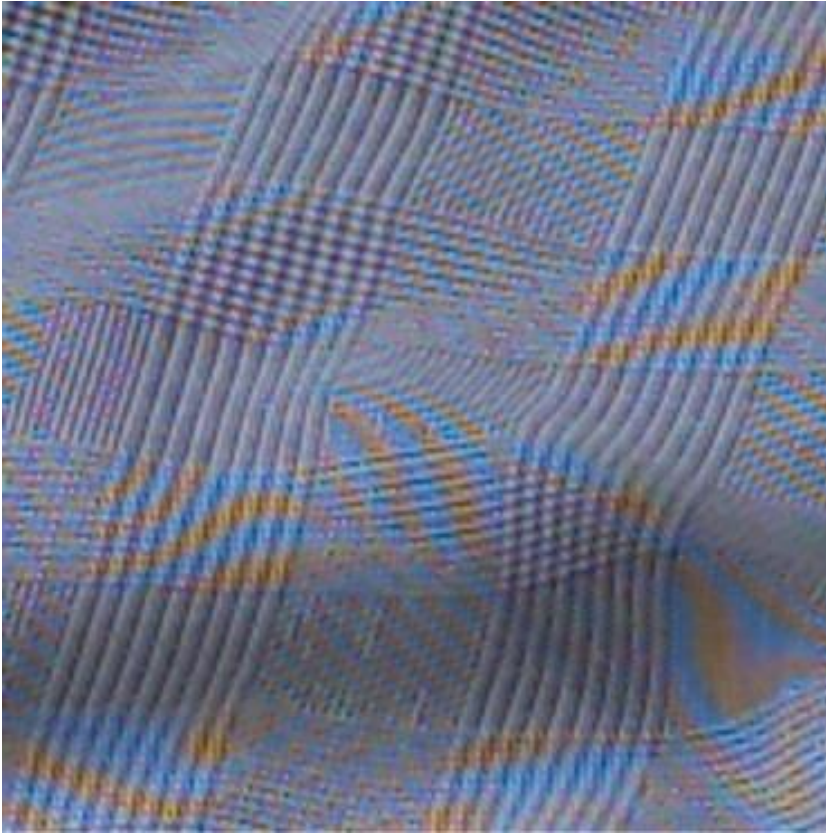


blue

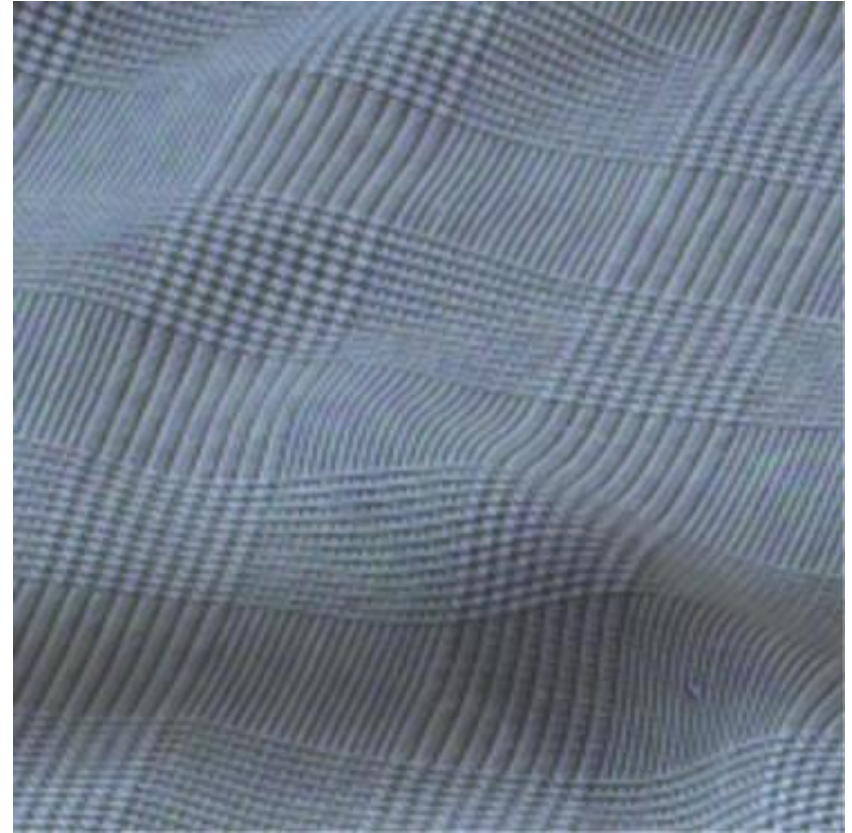


output

# Foveon X3 sensor



Bayer CFA



X3 sensor

## Camera with X3



**Sigma SD10, SD9**



**Polaroid X530**

# Sigma SD9 vs Canon D30





# Color Processing

- After color values are recorded, more color processing usually happens:
  - White balance
  - Non-linearity to approximate film response or match TV monitor gamma

# White Balance

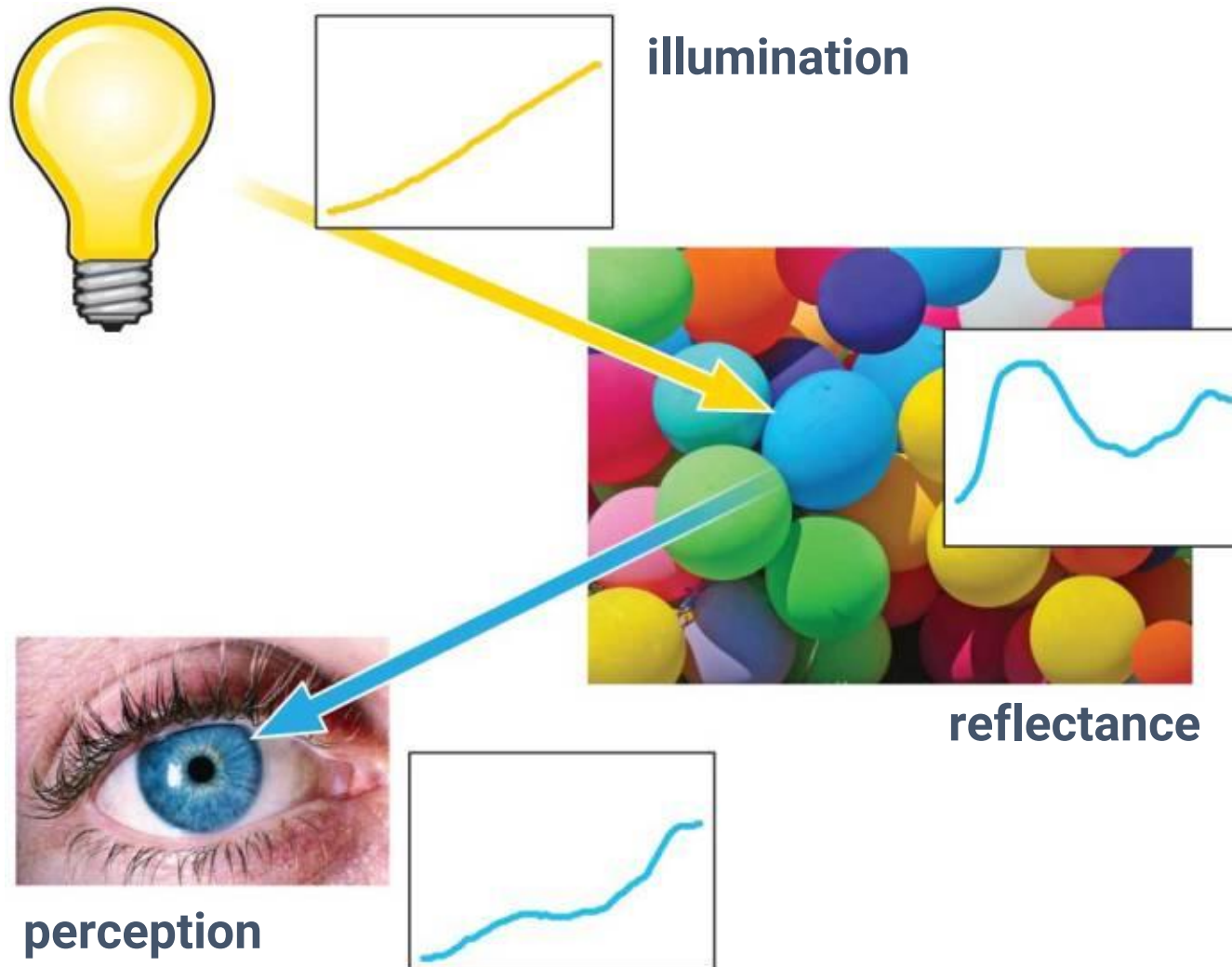


warmer +3



automatic white balance

# White Balance (cont.)

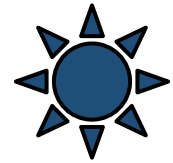
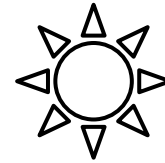


# Color Constancy



What color is the dress?

# Color Constancy (cont.)



# Human Vision is Complex

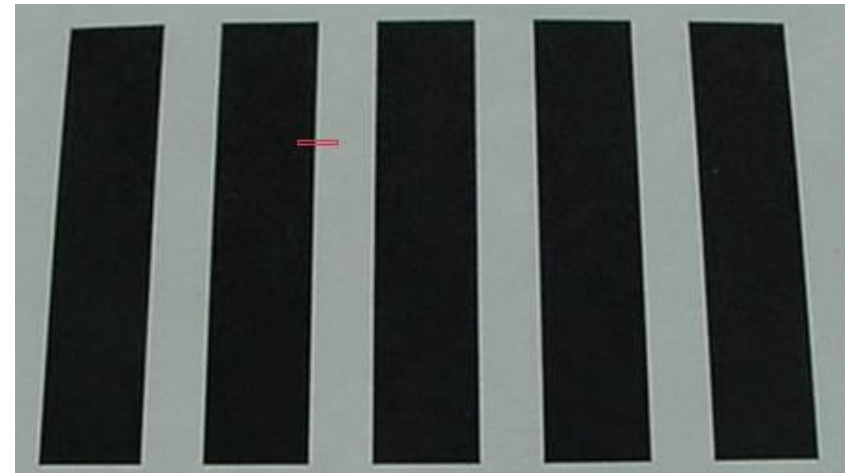
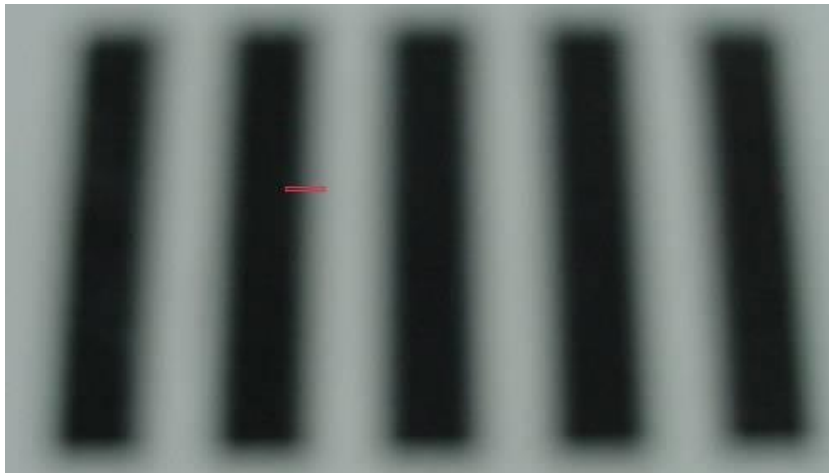
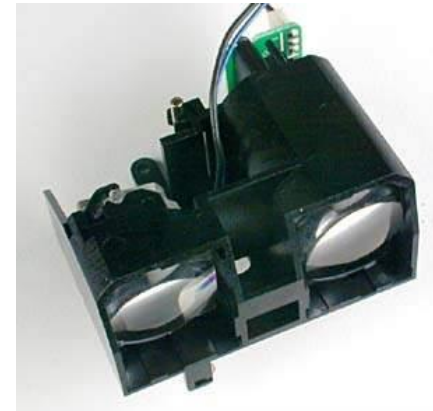


**じえねくす** @Luiselotte\_lily · 8h  
服の色の話について  
人間の脳は自動的に対象の周囲の明度に合わせて色に補正をかけます  
その時の強弱に大きな個人差があるので人によって見え方が変わります  
本来は青黒だそうですがどちらが正解やどちらに見えたから～ということはないと思われま

← 1K ★ 589 ...

# Autofocus

- Active
  - Sonar
  - Infrared
- Passive



# Computational Cameras

**THERMAL IR**

**XBOX KINECT**

**PMD**

**LYTRO**

**LEAP MOTION**

**SOFT KINETIC**

**GOOGLE GLASS**

**MESA**

**MAS.541**  
Thu 9a-12p  
Room 9-057  
Computational Camera:  
Google Glass, Microsoft  
Kinect and Apps

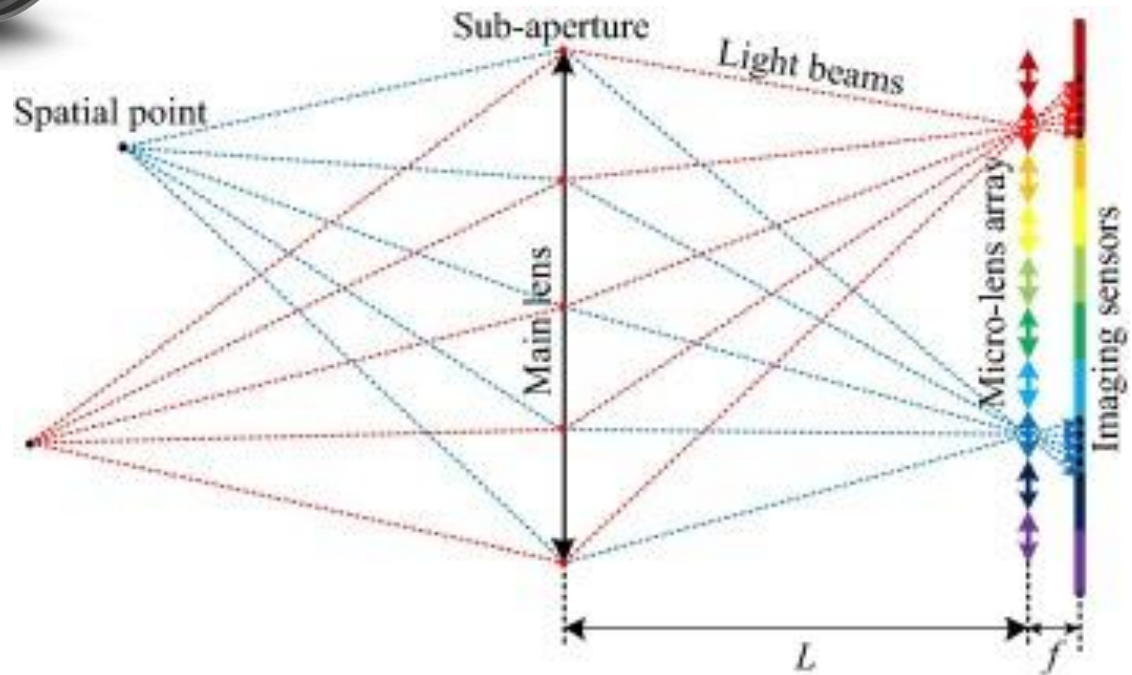




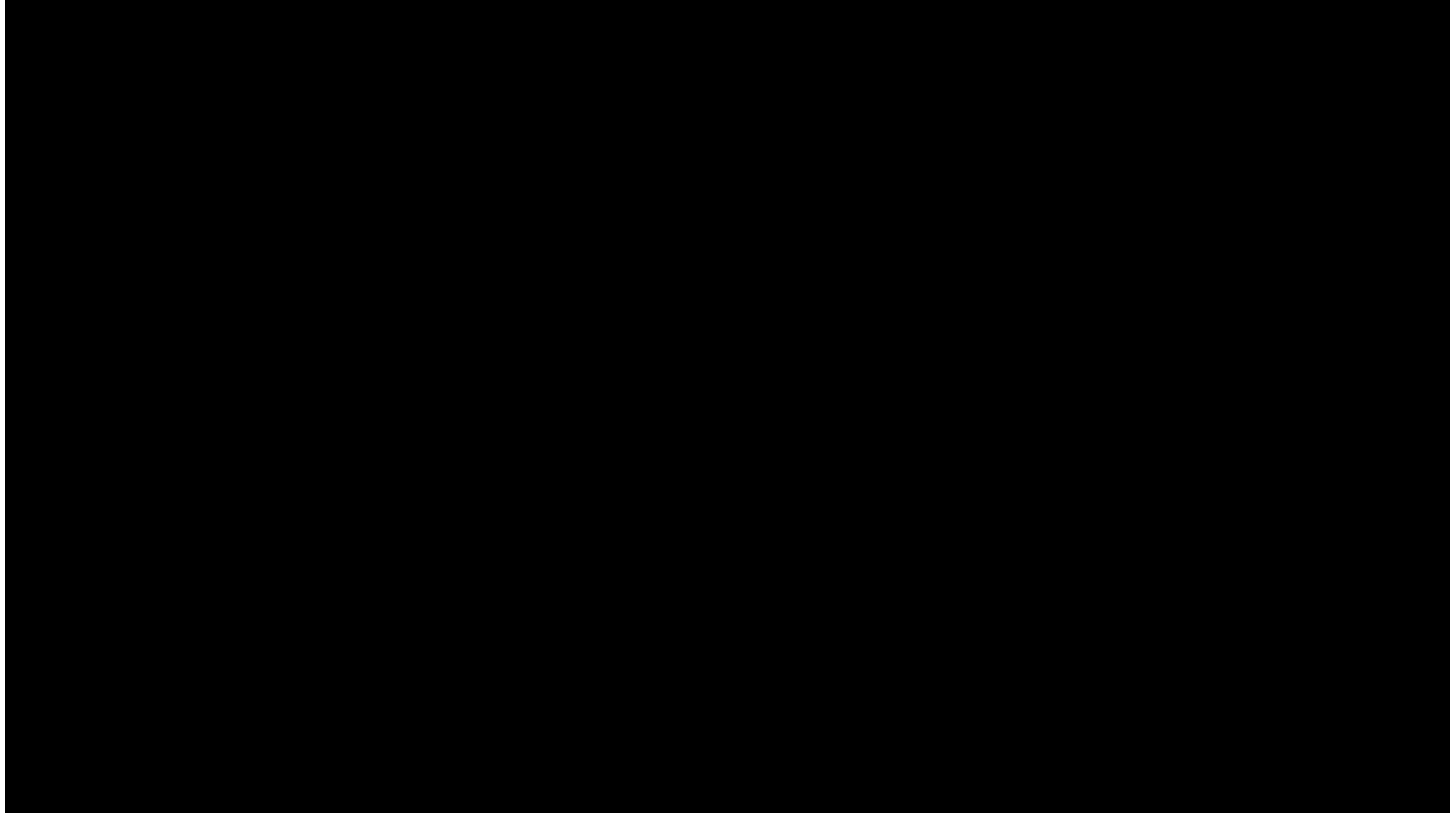
# Light-field Camera



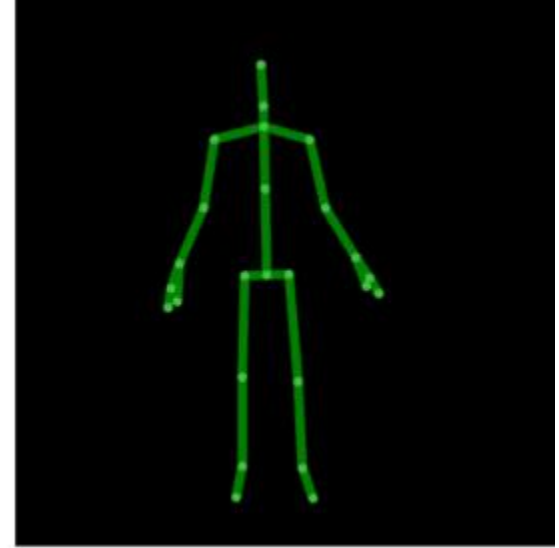
Lytro Illum



# Light-field Camera (cont.)



# RGB-D Camera



# RGB-D Camera



# Egocentric (First-Person) Vision



**Input:** Egocentric video of the camera wearer's day



1:00 pm

2:00 pm

3:00 pm

4:00 pm

5:00 pm

6:00 pm

**Output:** Storyboard summary of important people and objects

# References

- <http://www.howstuffworks.com/digital-camera.htm>
- <http://electronics.howstuffworks.com/autofocus.htm>
- Ramanath, Snyder, Bilbro, and Sander. [Demosaicking Methods for Bayer Color Arrays](#), Journal of Electronic Imaging, 11(3), pp306-315.
- Rajeev Ramanath, Wesley E. Snyder, Youngjun Yoo, Mark S. Drew, [Color Image Processing Pipeline in Digital Still Cameras](#), IEEE Signal Processing Magazine Special Issue on Color Image Processing, vol. 22, no. 1, pp. 34-43, 2005.
- <http://www.worldatwar.org/photos/whitebalance/index.mhtml>
- <http://www.100fps.com/>