



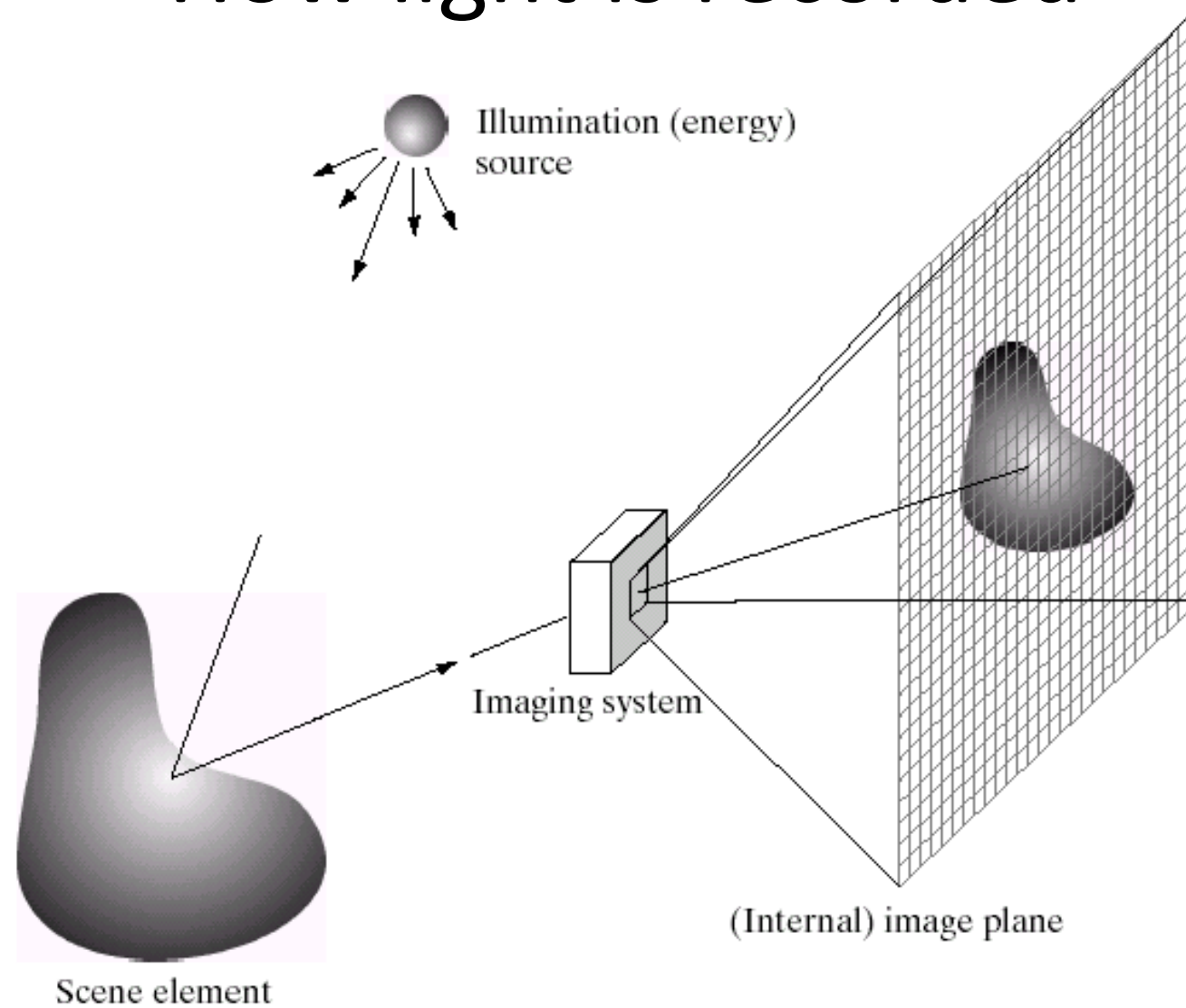
# COMPUTER VISION

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# How light is recorded



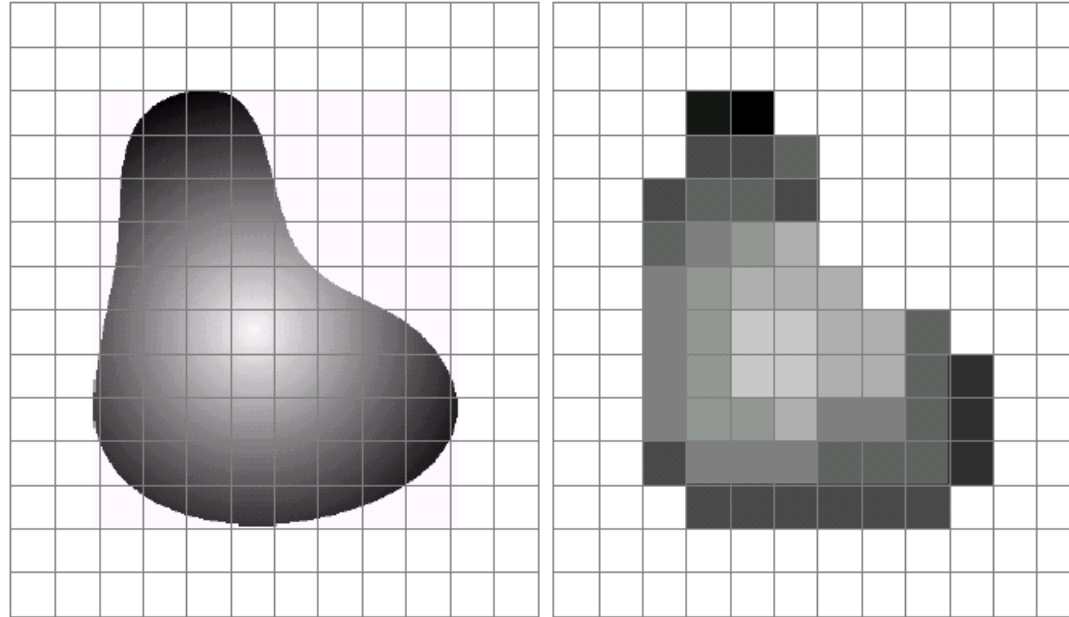
# Digital camera



A digital camera replaces film with a sensor array

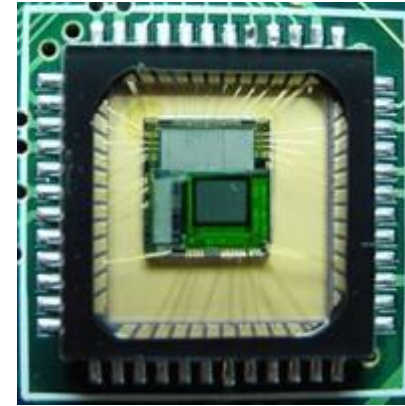
- Each cell in the array is light-sensitive diode that converts photons to electrons
- Two common types: Charge Coupled Device (CCD) and CMOS
- <http://electronics.howstuffworks.com/cameras-photography/digital/question362.htm>

# Sensor Array



a b

**FIGURE 2.17** (a) Continuous image projected onto a sensor array. (b) Result of image sampling and quantization.



CMOS sensor

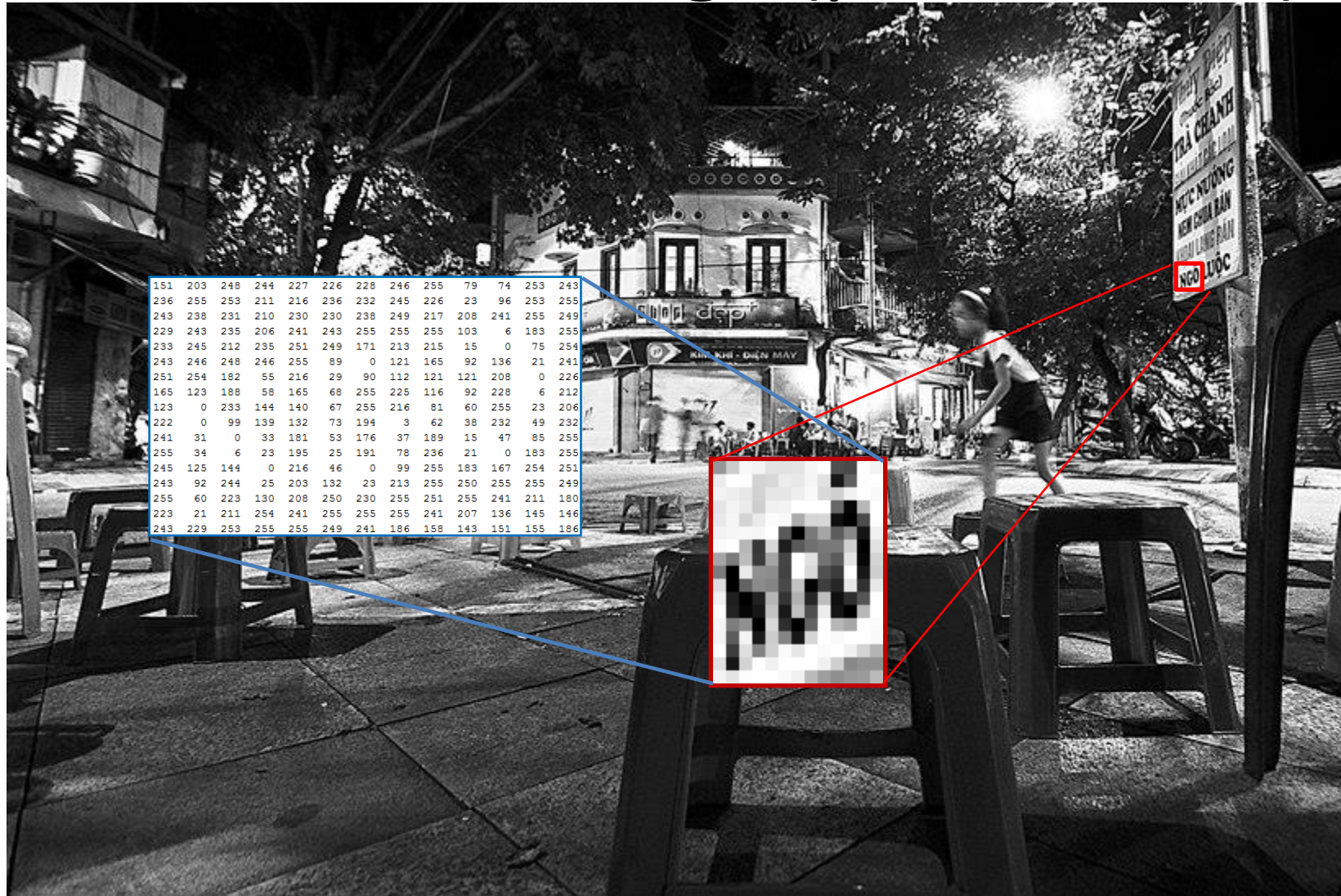
Each sensor cell records amount of light coming in at a small range of orientations

# The raster image (pixel matrix)





# The raster image (pixel matrix)

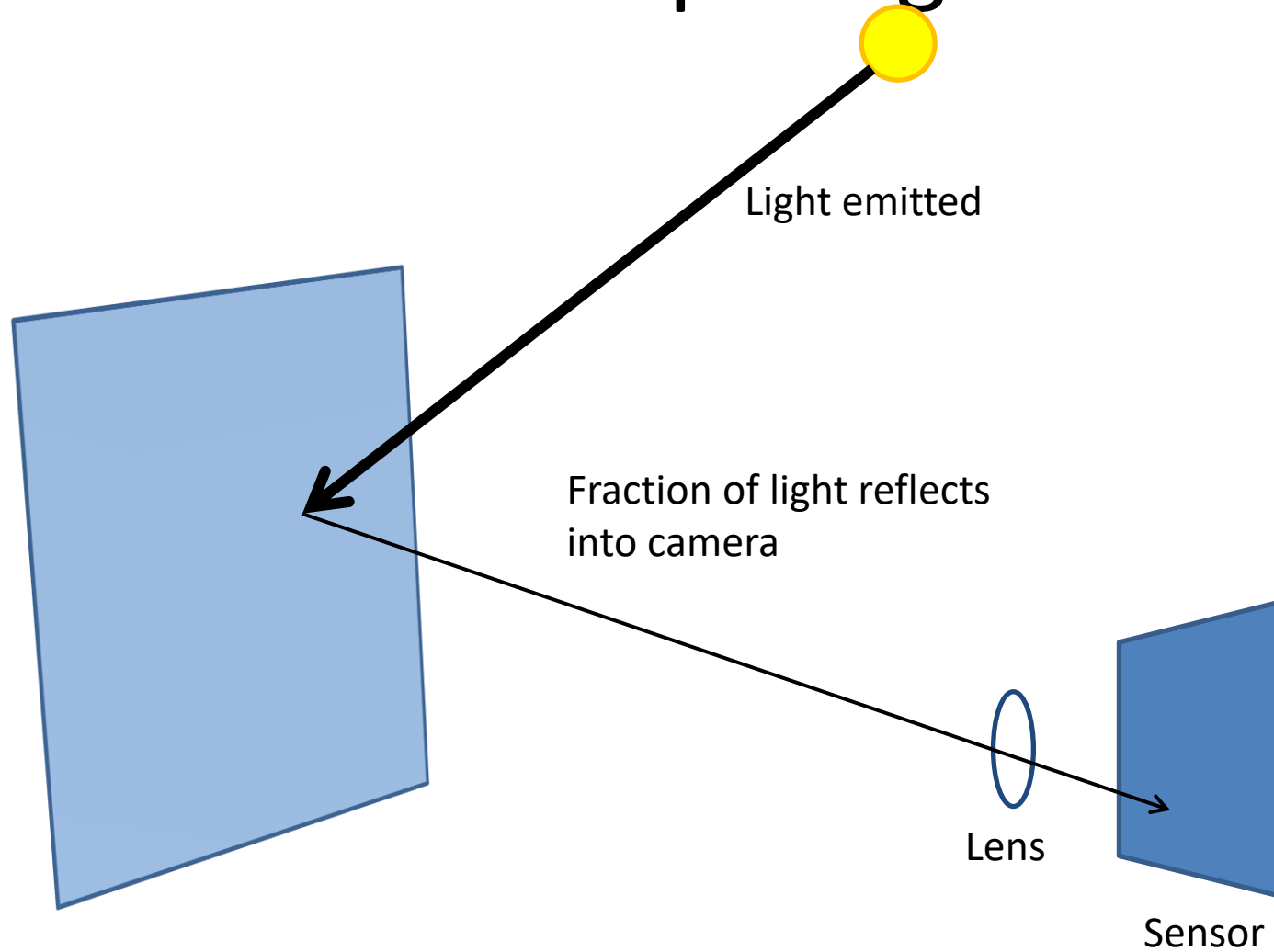


# Today's class: Light and Shading



- What determines a pixel's intensity?
- What can we infer about the scene from pixel intensities?

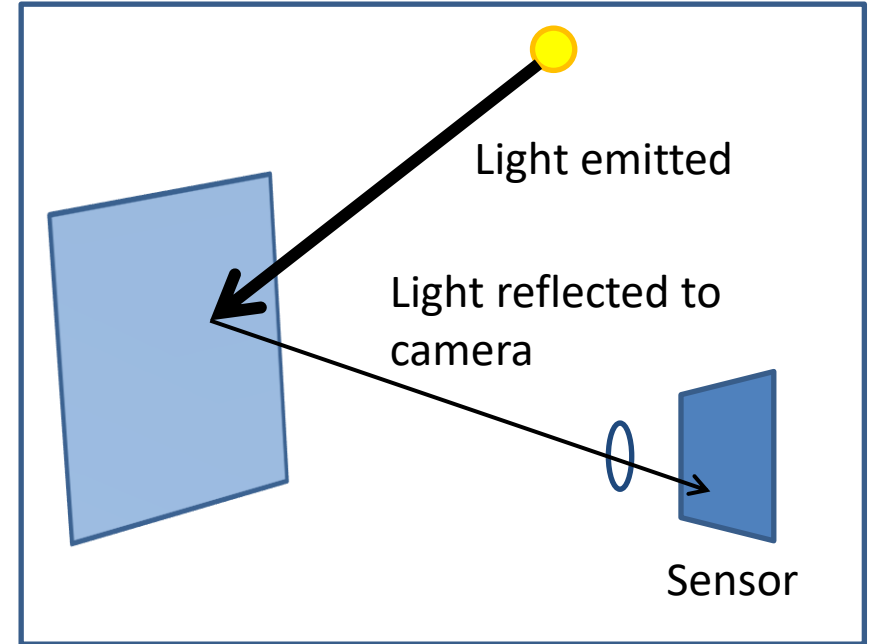
# How does a pixel get its value?





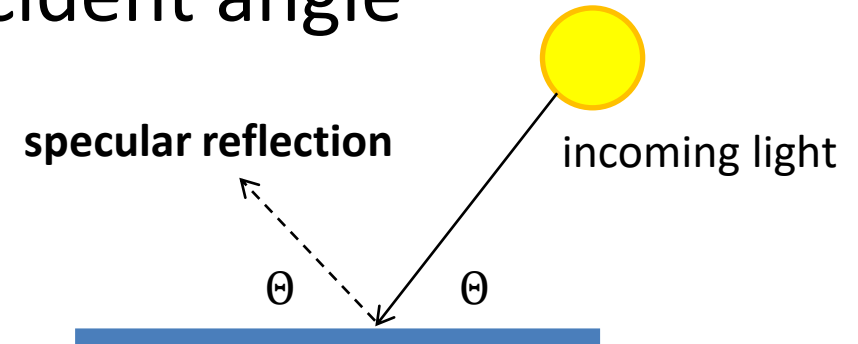
# How does a pixel get its value?

- Major factors
  - Illumination strength and direction
  - Surface geometry
  - Surface material
  - Nearby surfaces
  - Camera gain/exposure

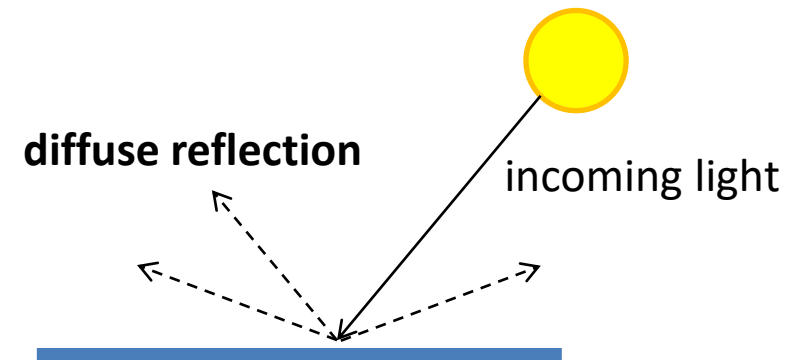


# Basic models of reflection

- Specular: light bounces off at the incident angle
  - E.g., mirror

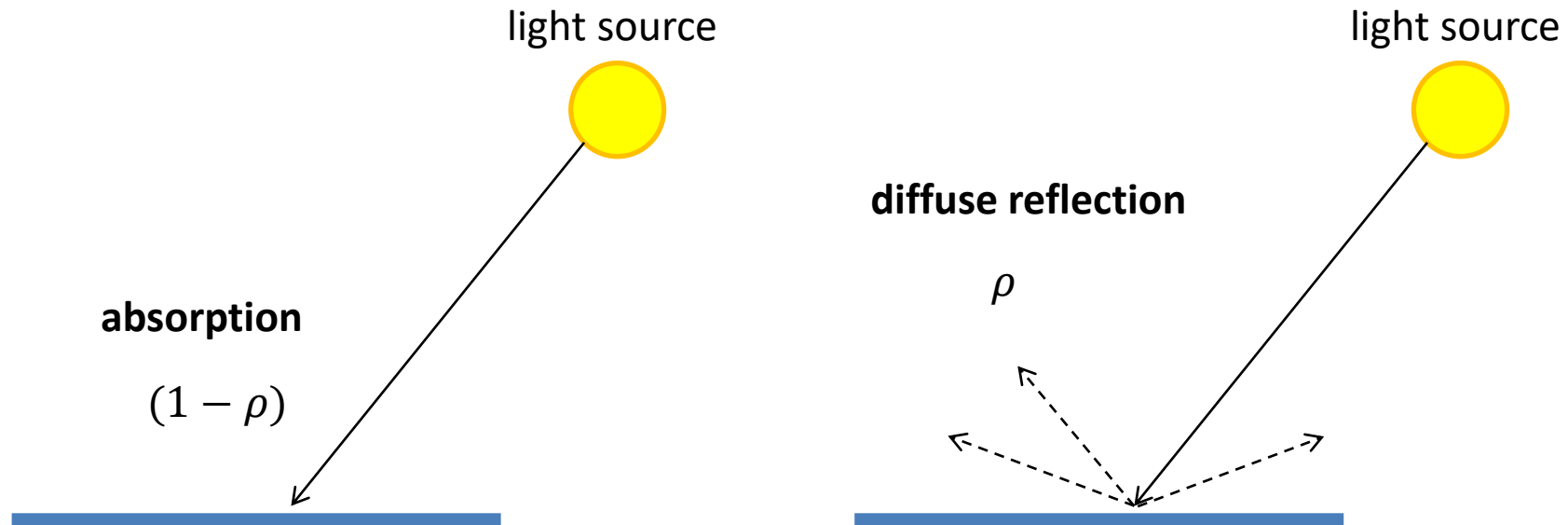


- Diffuse: light scatters in all directions
  - E.g., brick, cloth, rough wood



# Lambertian reflectance model

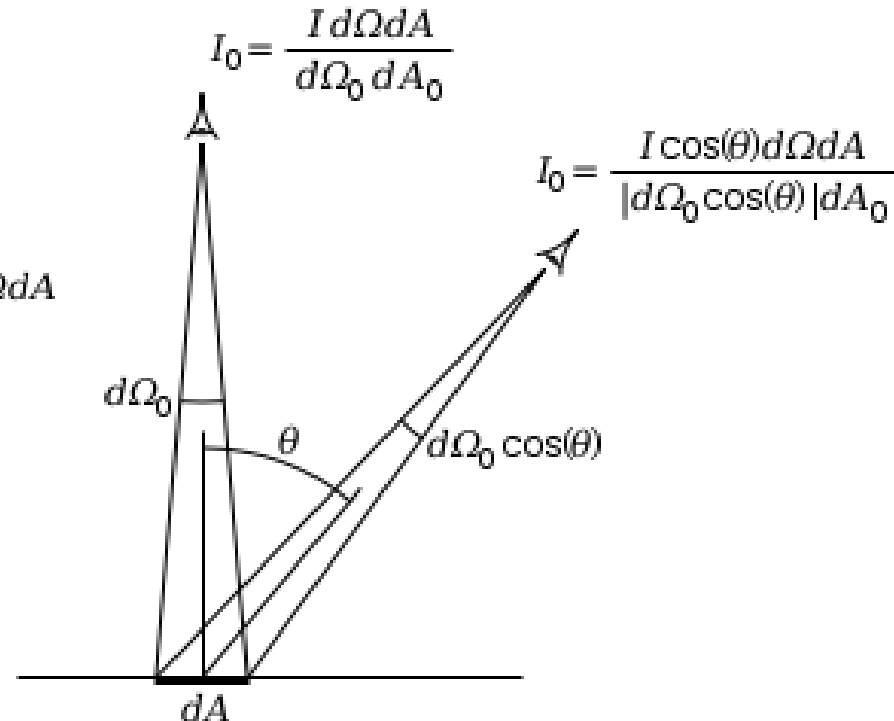
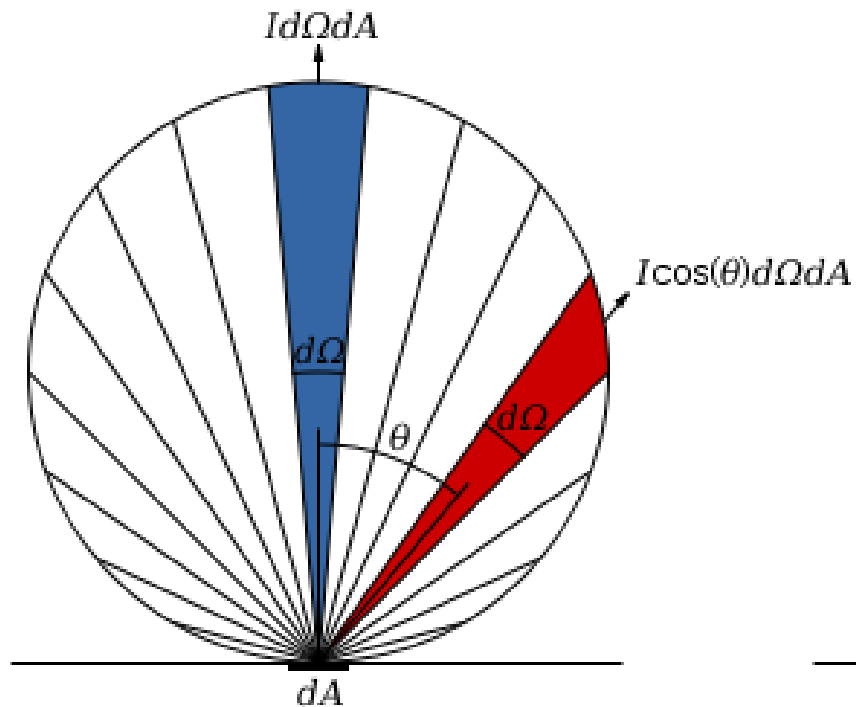
- Some light is absorbed (function of albedo  $\rho$ )
- Remaining light is scattered (diffuse reflection)
- Examples: soft cloth, concrete, matte paints



# Diffuse reflection: Lambert's cosine law

Intensity does *not* depend on viewer angle.

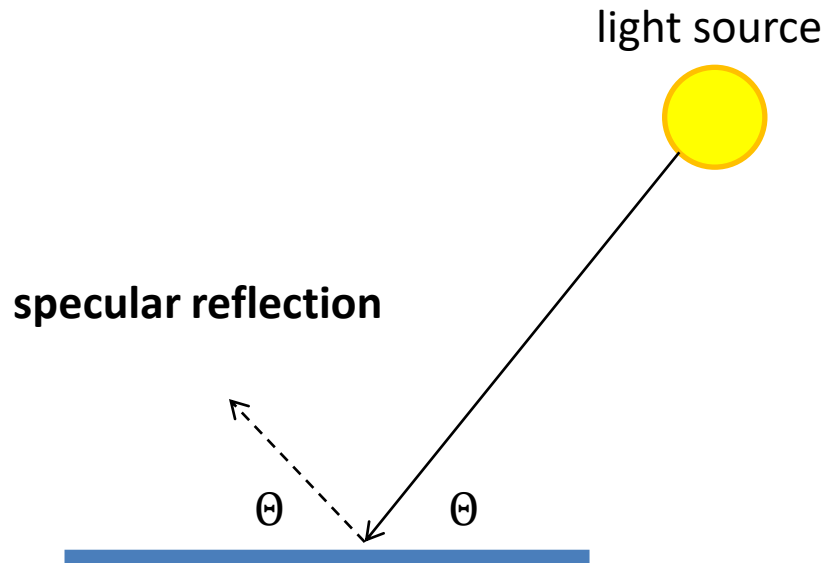
- Amount of reflected light proportional to  $\cos(\theta)$
- Visible solid angle also proportional to  $\cos(\theta)$





# Specular Reflection

- Reflected direction depends on light orientation and surface normal
  - E.g., mirrors are fully specular
  - Most surfaces can be modeled with a mixture of diffuse and specular components



Flickr, by suzysputnik



Flickr, by piratejohnny

# Most surfaces have both specular and diffuse components

- Specularity = spot where specular reflection dominates (typically reflects light source)

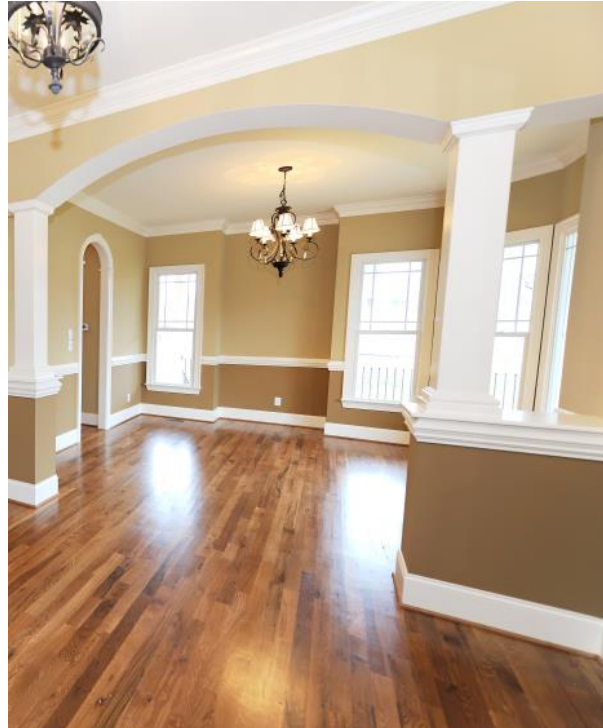


Photo: northcountryhardwoodfloors.com



Typically, specular component is small

# Intensity and Surface Orientation

Intensity depends on illumination angle because less light comes in at oblique angles.

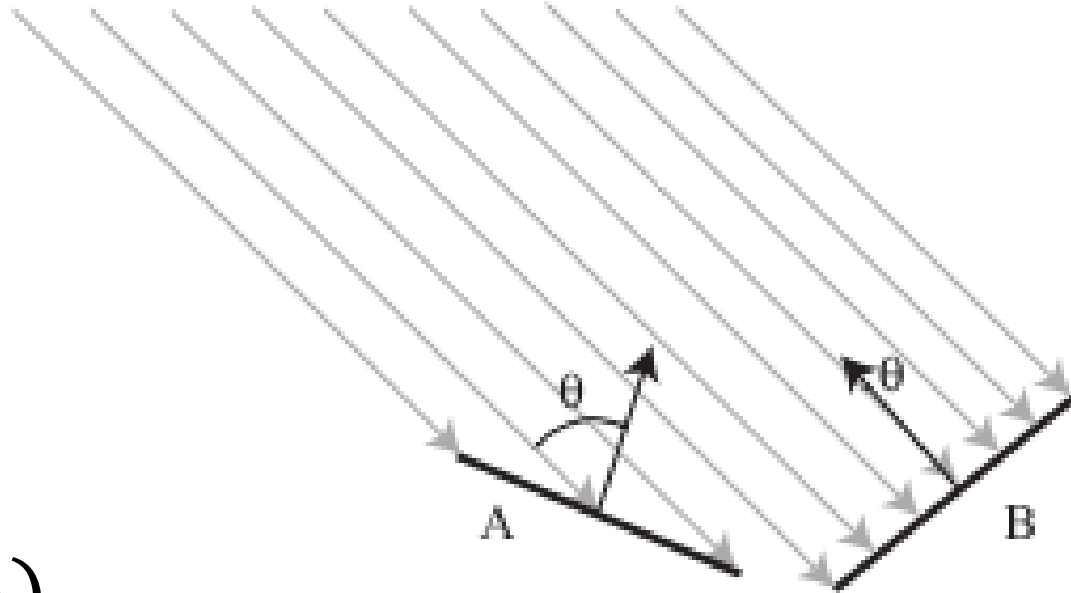
$\rho$  = albedo

$\mathbf{S}$  = directional source

$\mathbf{N}$  = surface normal

$I$  = reflected intensity

$$I(x) = \rho(x)(\mathbf{S} \cdot \mathbf{N}(x))$$

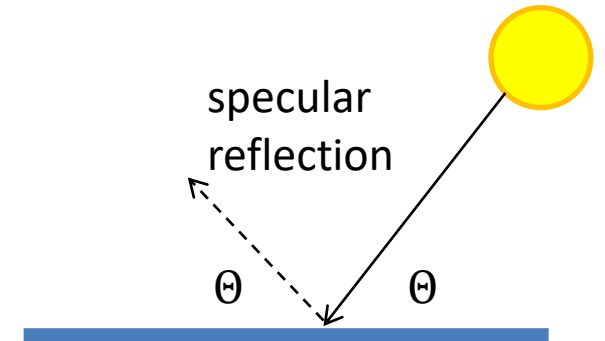
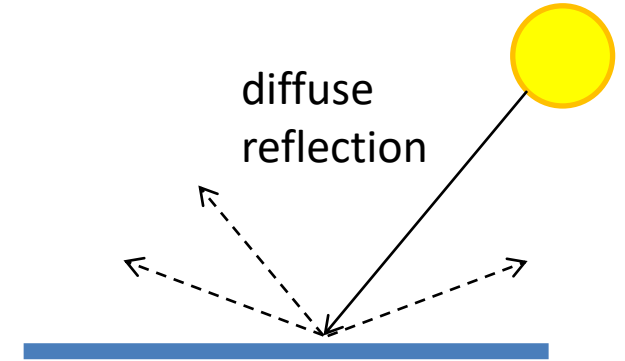
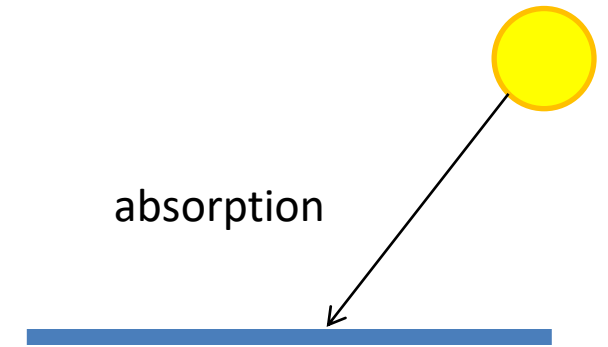




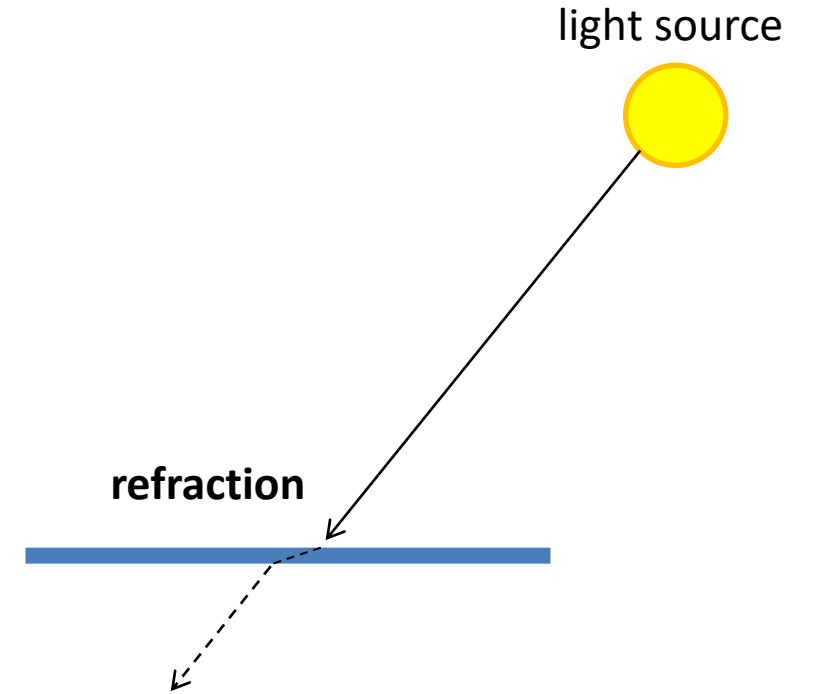
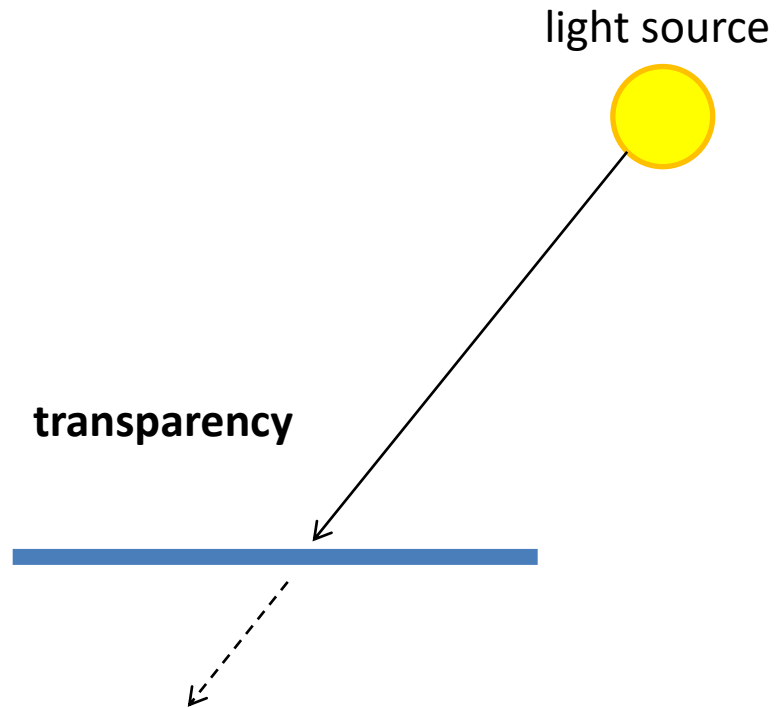


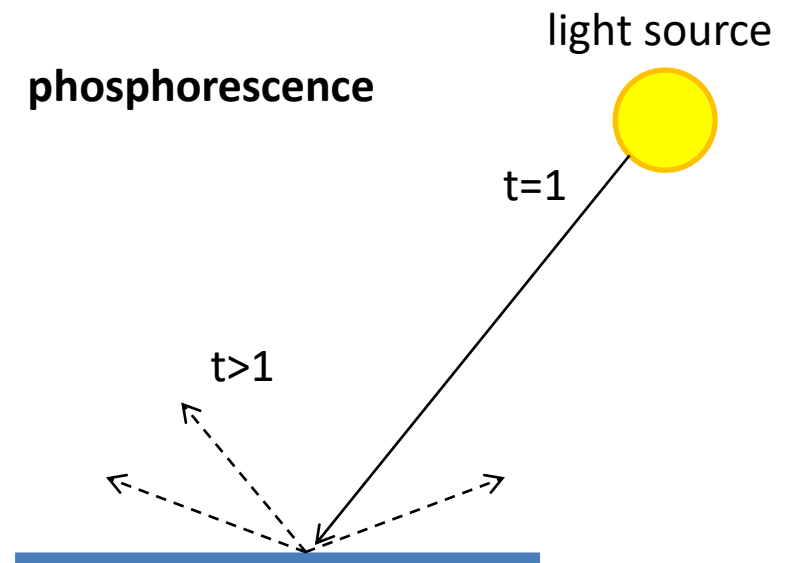
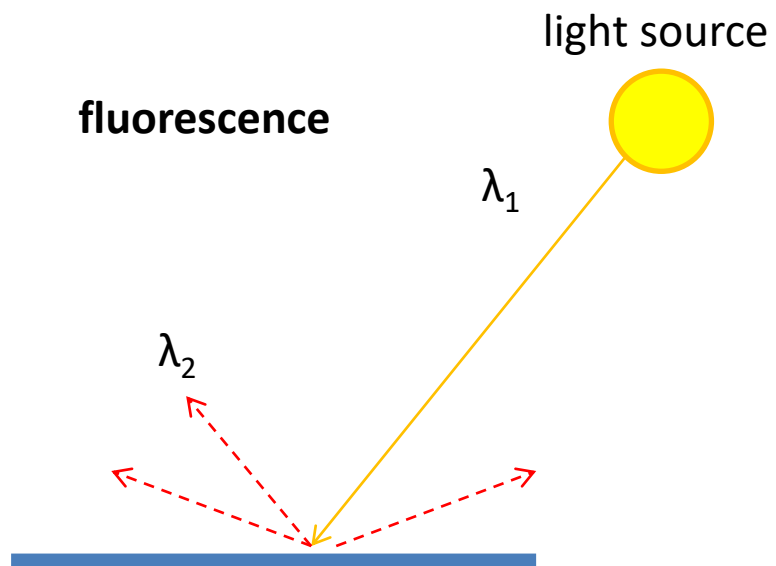
# Recap

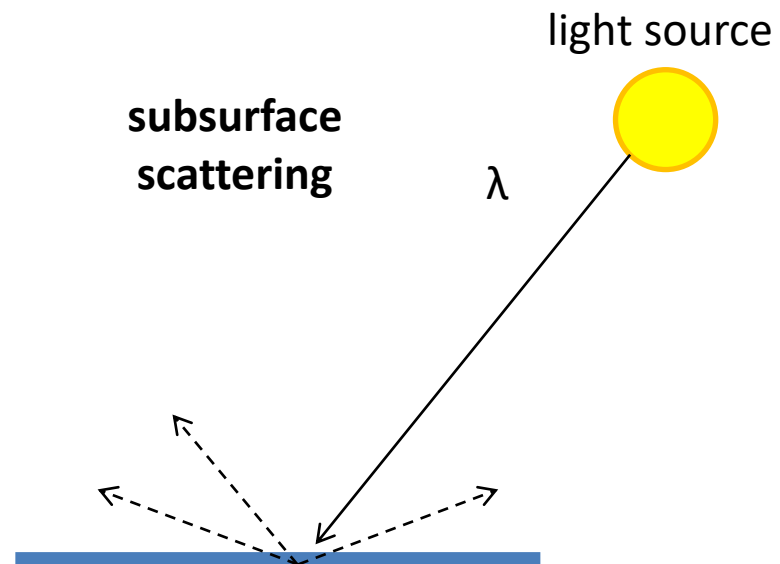
- When light hits a typical surface
  - Some light is absorbed ( $1-\rho$ )
    - More absorbed for low albedos
  - Some light is reflected diffusely
    - Independent of viewing direction
  - Some light is reflected specularly
    - Light bounces off (like a mirror), depends on viewing direction



# Other possible effects



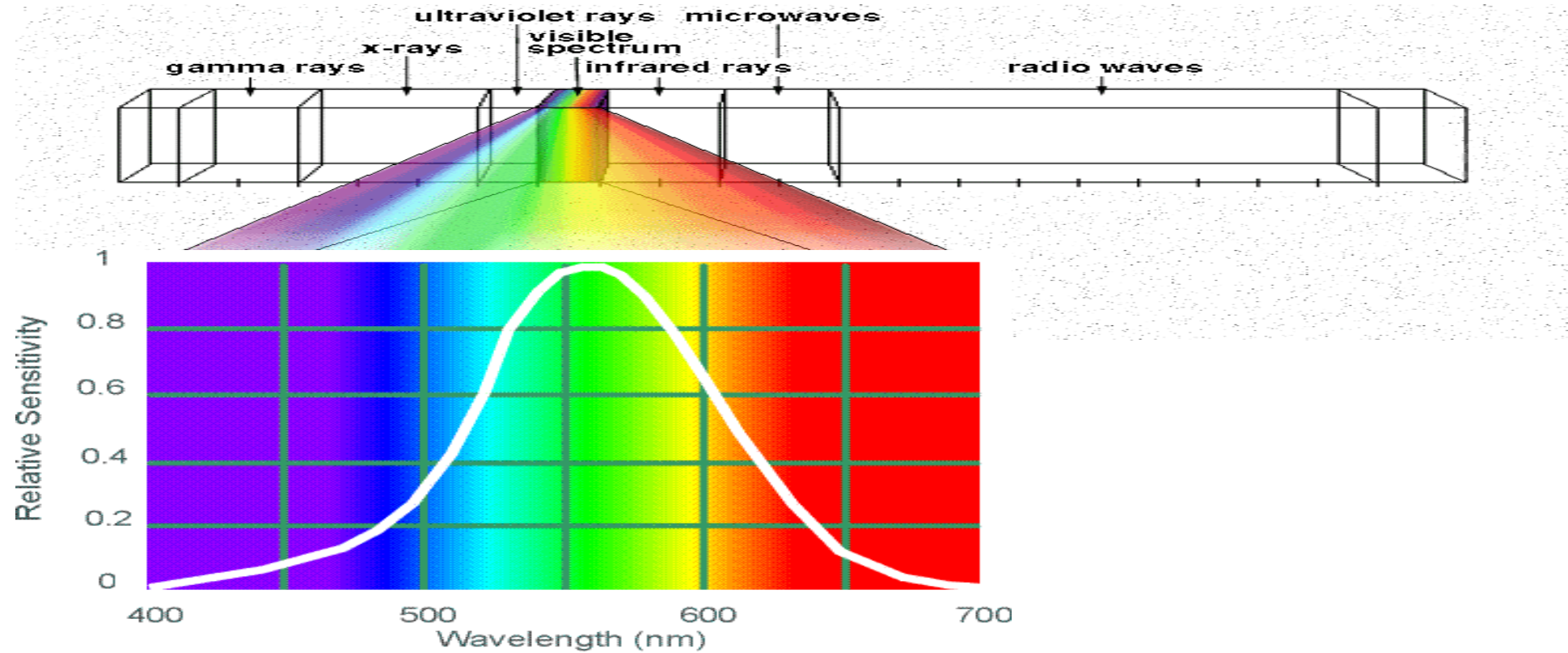






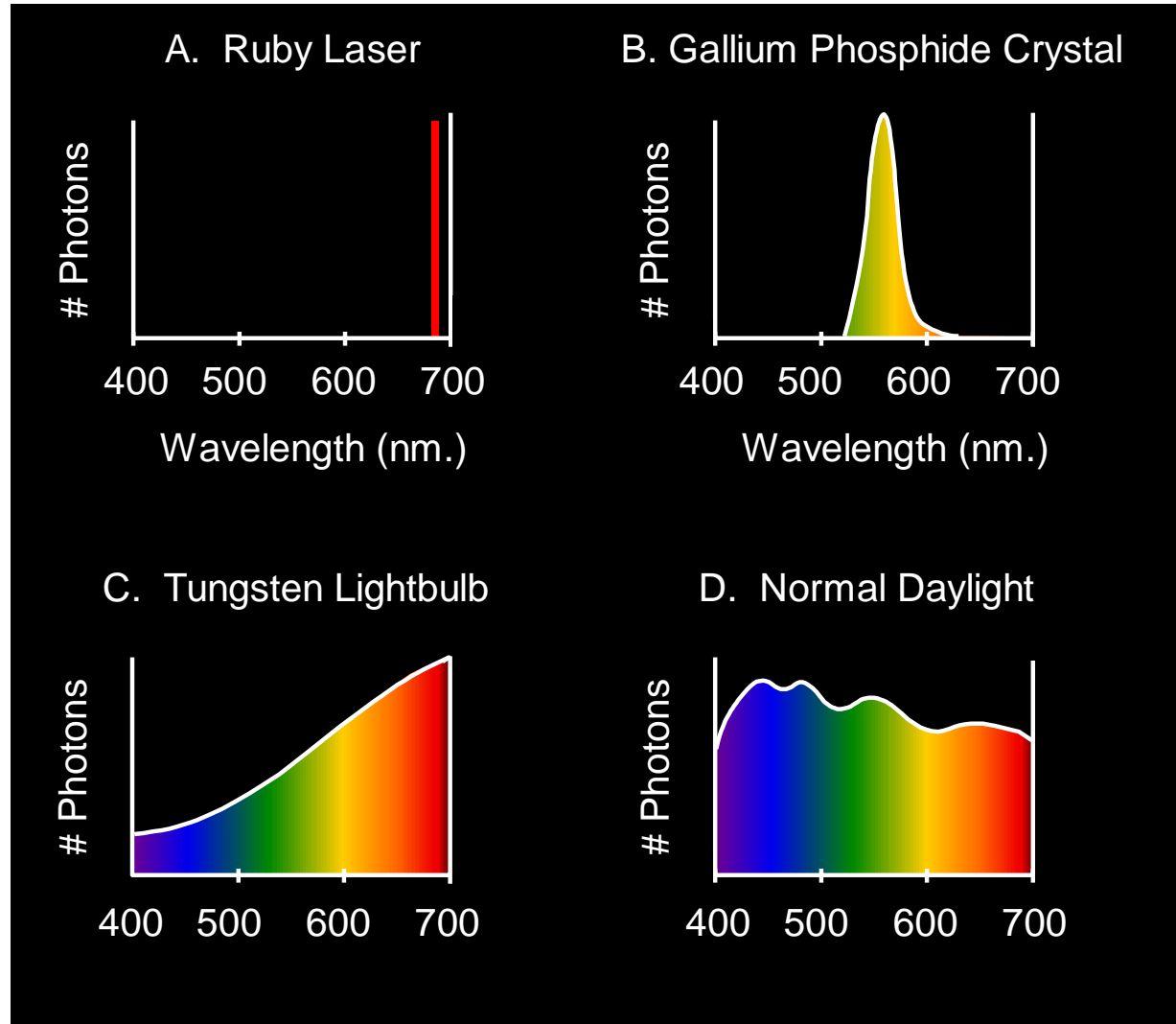
# Color

Light is composed of a spectrum of wavelengths

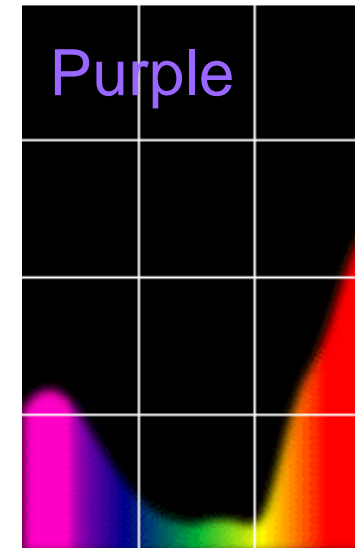
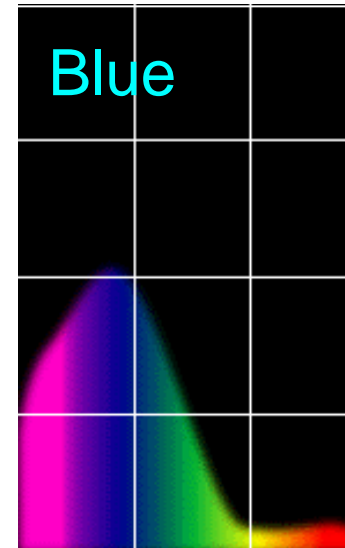
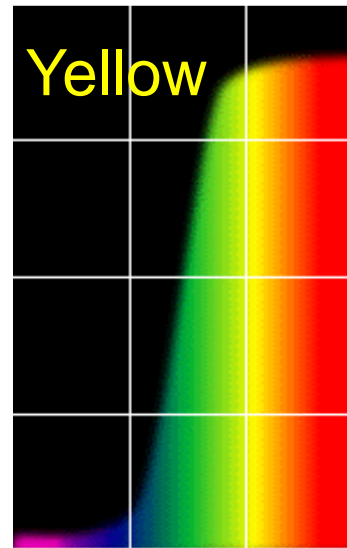
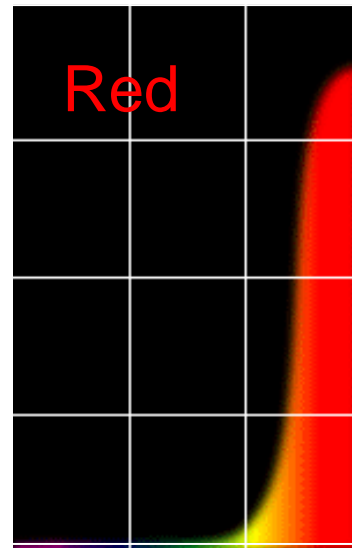


Human Luminance Sensitivity Function

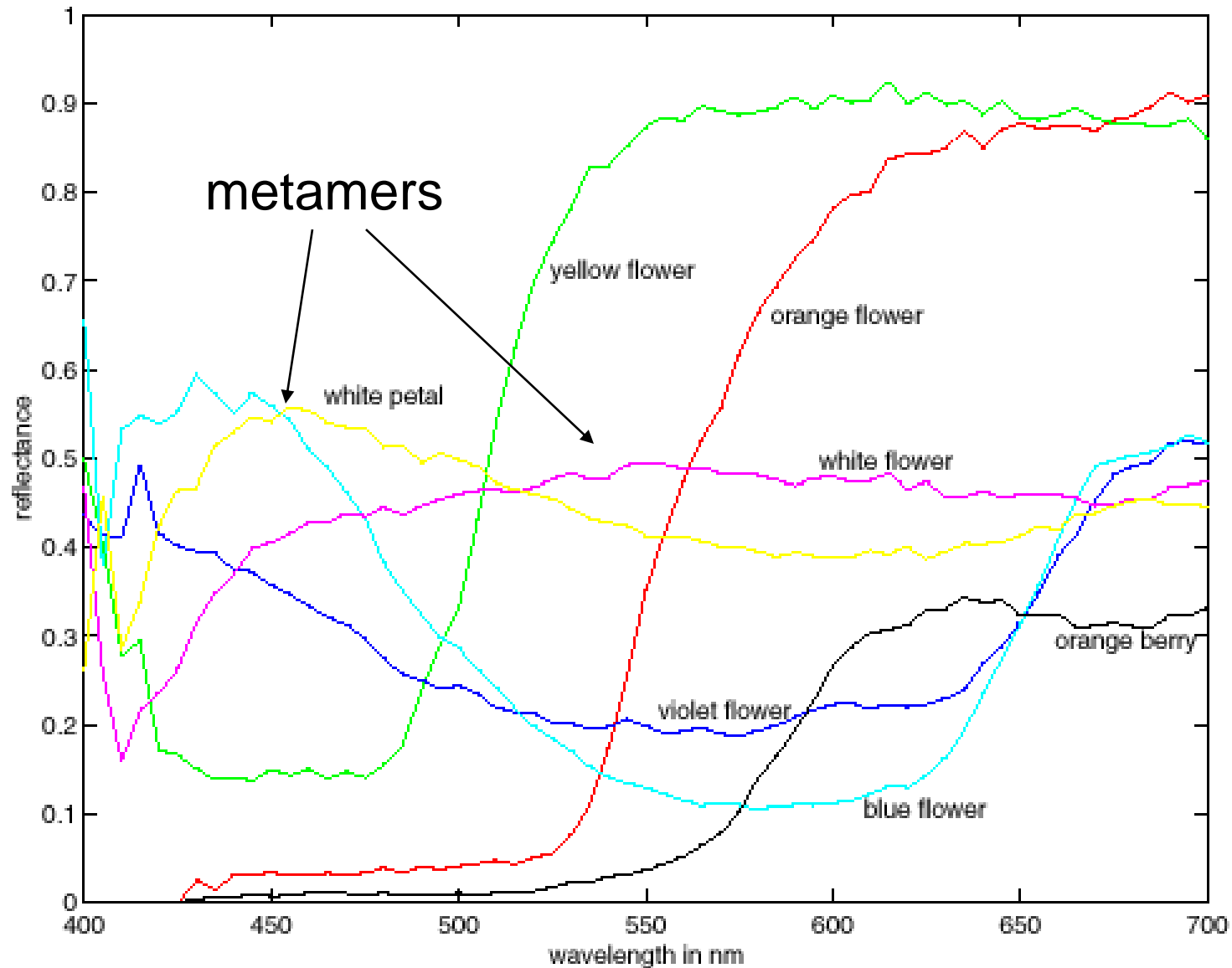
# Some examples of the spectra of light sources



# Some examples of the reflectance spectra of surfaces



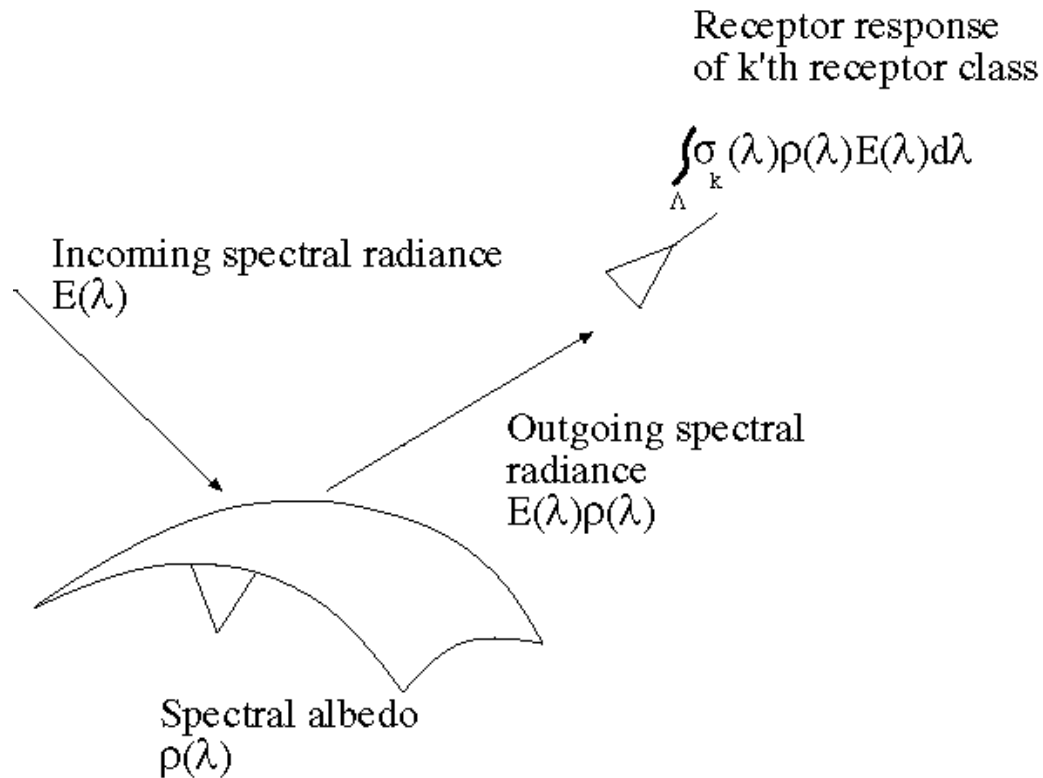
# More spectra



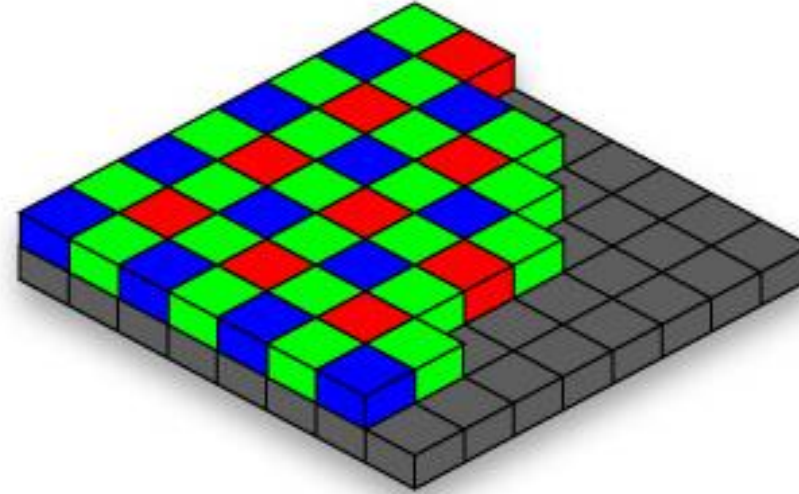


# The color of objects

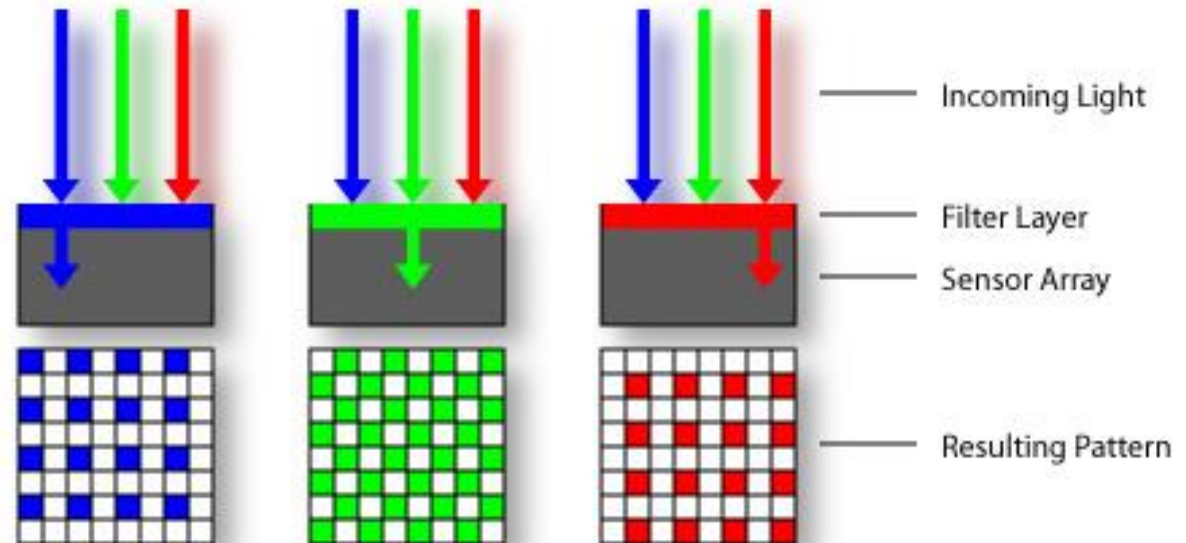
- Colored light arriving at the camera involves two effects
  - The color of the light source (illumination + inter-reflections)
  - The color of the surface



# Color Sensing: Bayer Grid



- Estimate RGB at each cell from neighboring values



# Which image plane is R, G, or B?

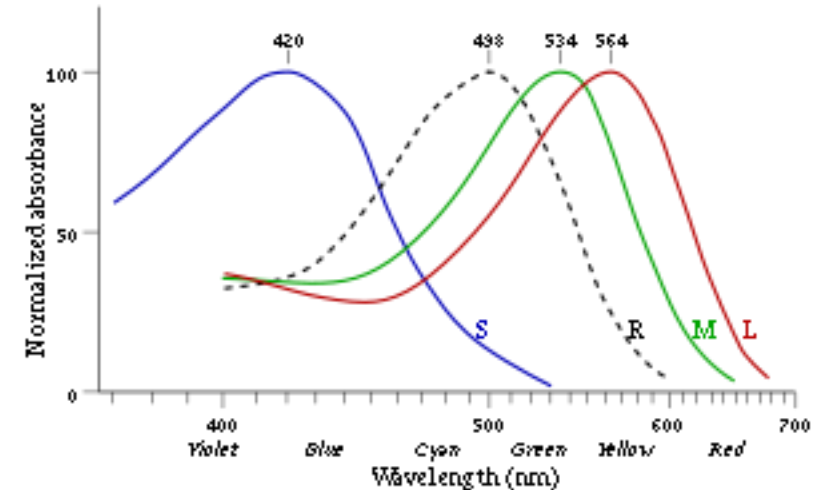


# Why RGB?

If light is a spectrum, why are images RGB?

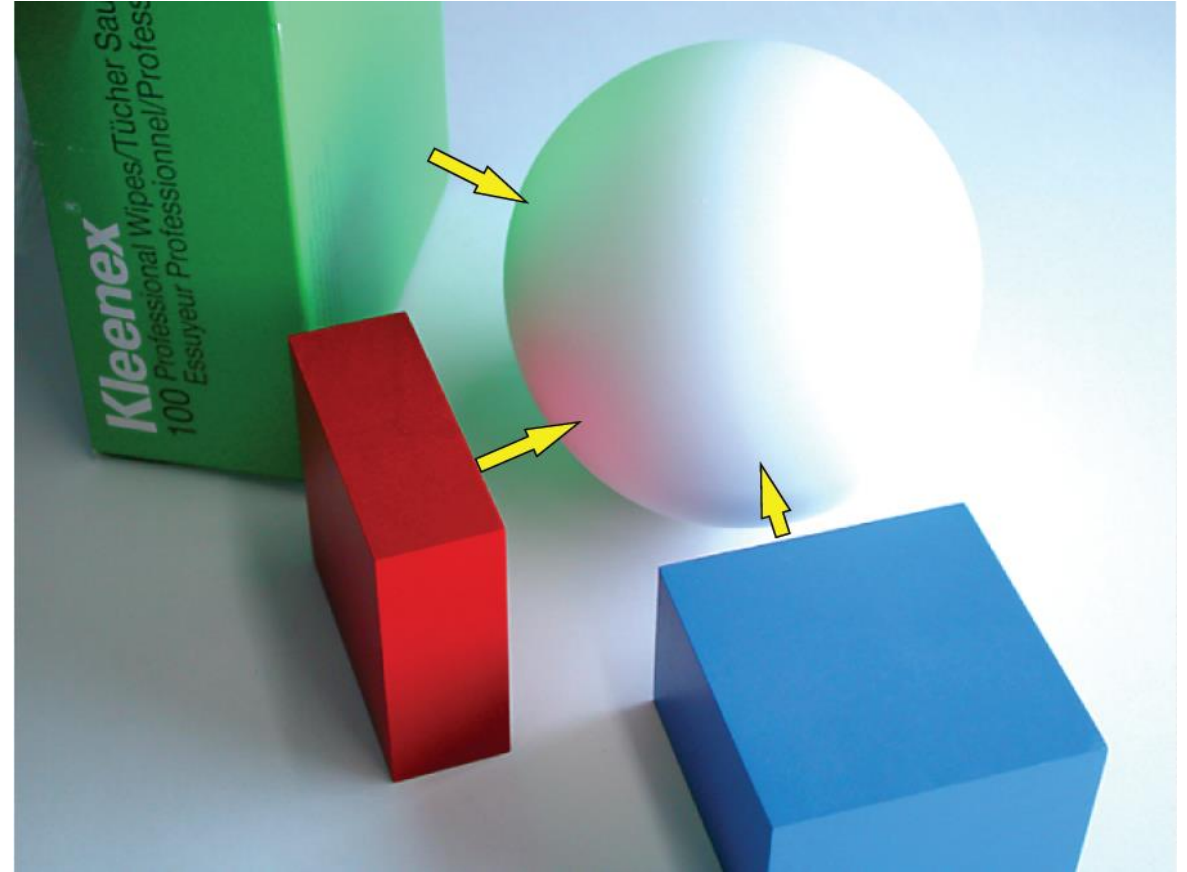
# Human color receptors

- Long (red), Medium (green), and Short (blue) cones, plus intensity rods
- Fun facts
  - “M” and “L” on the X-chromosome
    - That’s why men are more likely to be color blind (see what it’s like:  
<http://www.vischeck.com/vischeck/vischeckURL.php>)
  - “L” has high variation, so some women are tetrachromatic
  - Some animals have 1 (night animals), 2 (e.g., dogs), 4 (fish, birds), 5 (pigeons, some reptiles/amphibians), or even 12 (mantis shrimp) types of cones



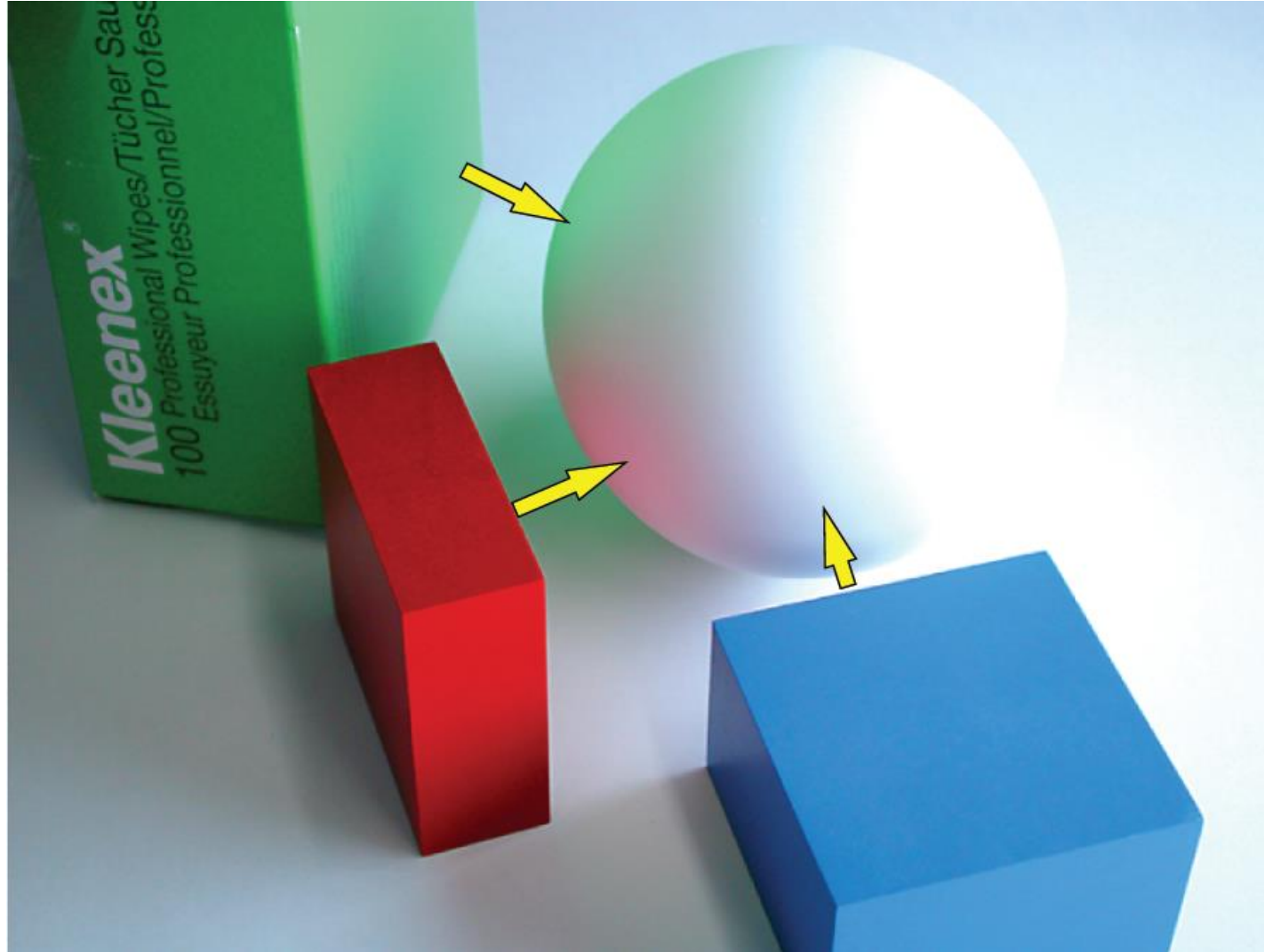
# So far: light → surface → camera

- Called a local illumination model
- But much light comes from surrounding surfaces



From Koenderink slides on image texture and the flow of light

## Inter-reflection affects the apparent color of objects

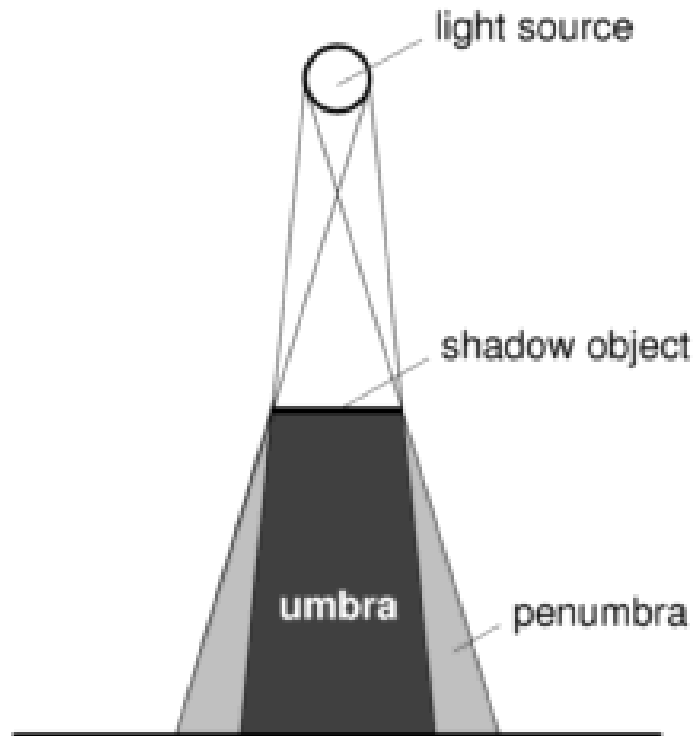


From Koenderink slides on image texture and the flow of light

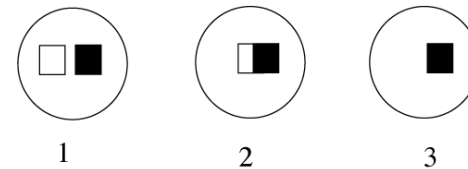
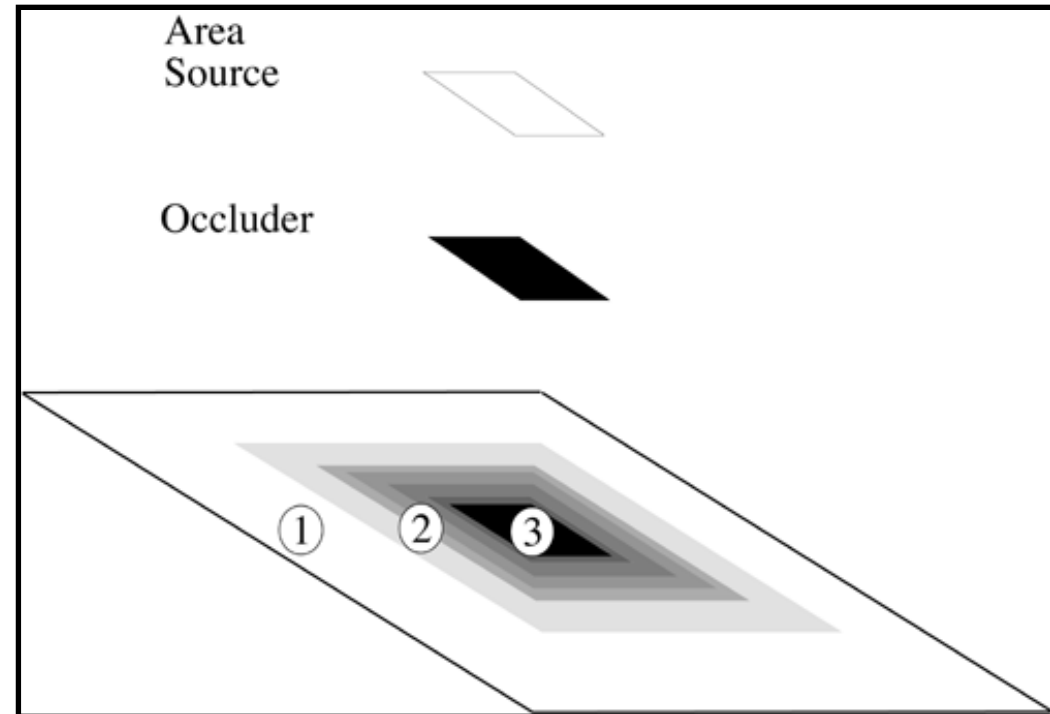
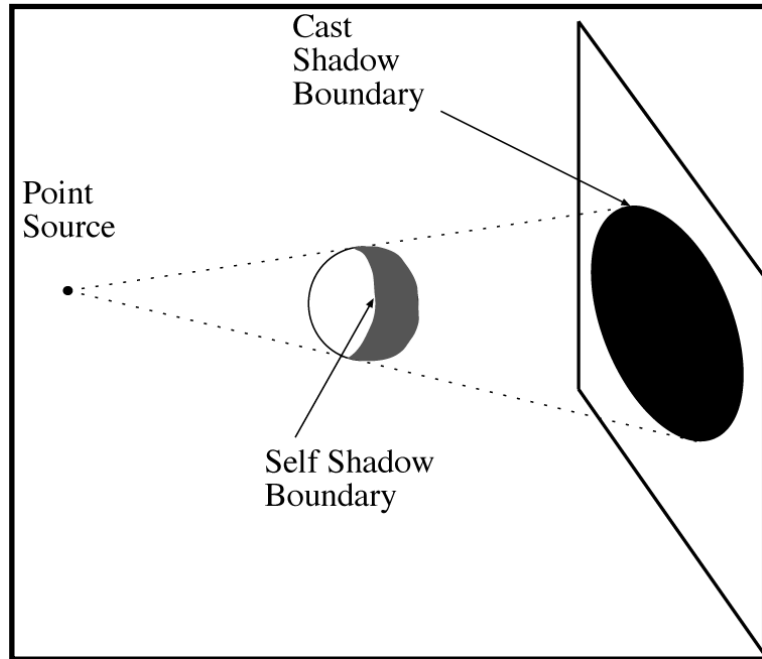


# Scene surfaces also cause shadows

- Shadow: reduction in intensity due to a blocked source



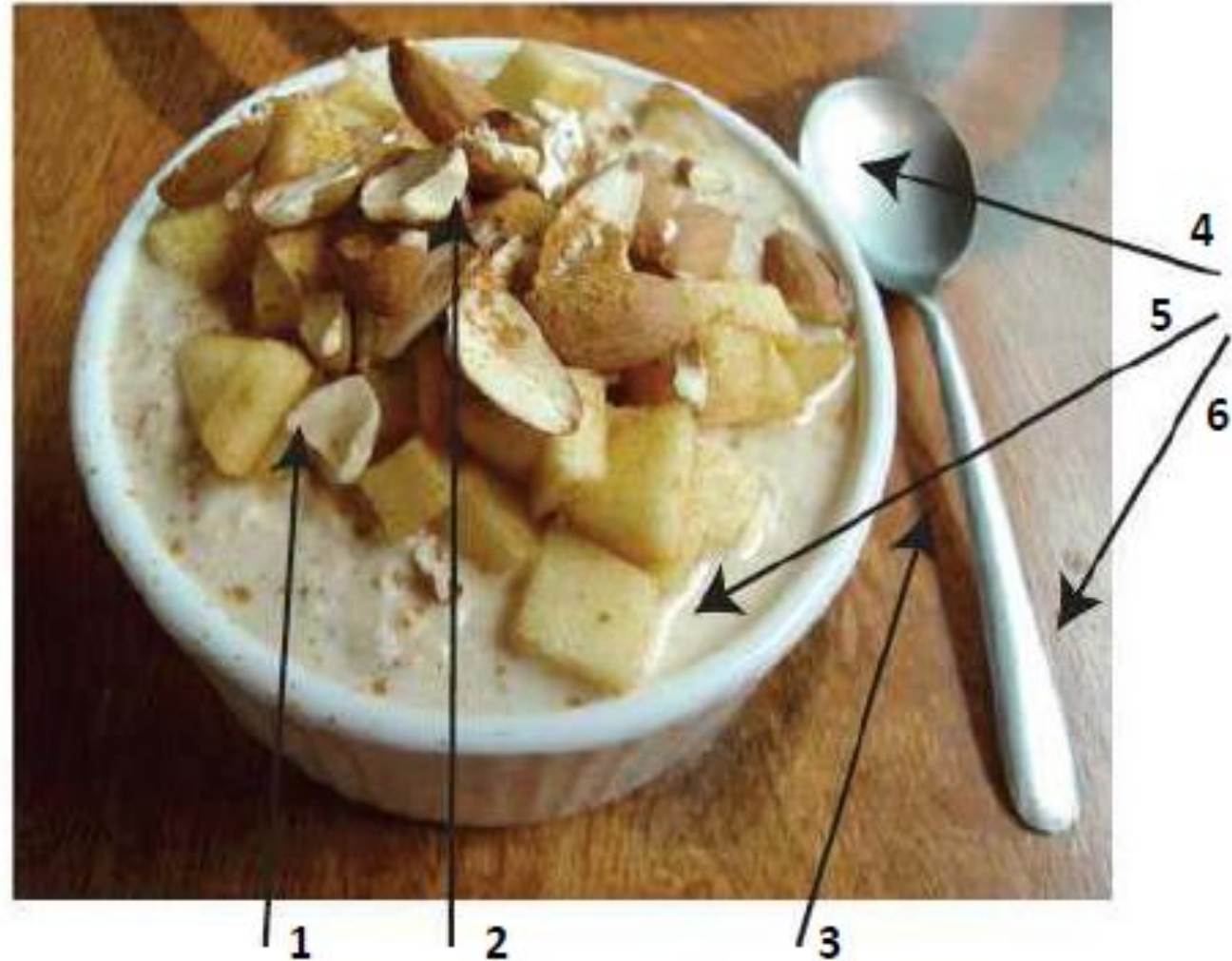
# Shadows



# Models of light sources

- Distant point source
  - One illumination direction
  - E.g., sun
- Area source
  - E.g., white walls, diffuser lamps, sky
- Ambient light
  - Substitute for dealing with interreflections
- Global illumination model
  - Account for interreflections in modeled scene

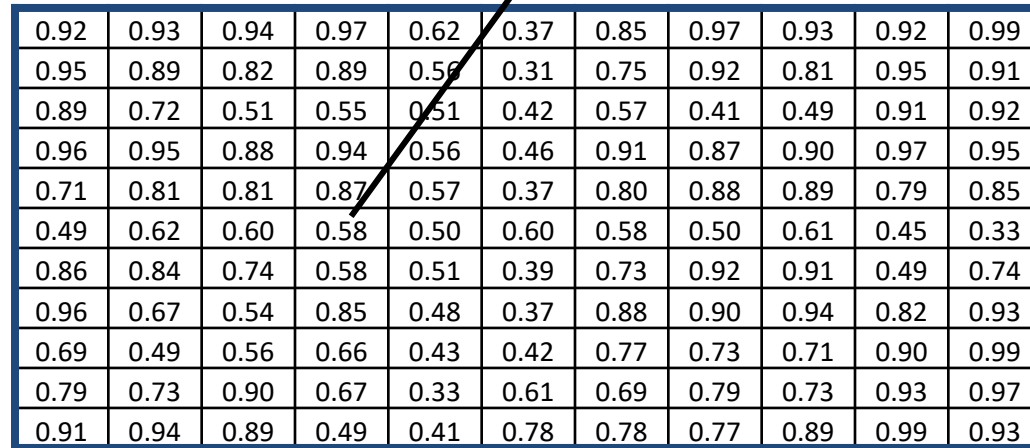
# Recap



Possible factors: albedo, shadows, texture, specularities, curvature, lighting direction

# What does the intensity of a pixel tell us?

$\text{im}(234, 452) = 0.58$

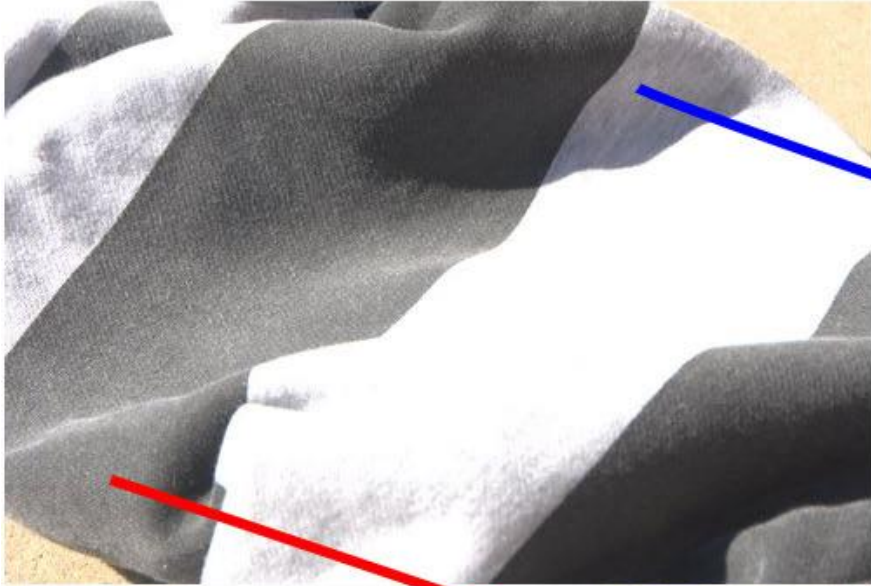


0.92	0.93	0.94	0.97	0.62	0.37	0.85	0.97	0.93	0.92	0.99
0.95	0.89	0.82	0.89	0.55	0.31	0.75	0.92	0.81	0.95	0.91
0.89	0.72	0.51	0.55	0.51	0.42	0.57	0.41	0.49	0.91	0.92
0.96	0.95	0.88	0.94	0.56	0.46	0.91	0.87	0.90	0.97	0.95
0.71	0.81	0.81	0.87	0.57	0.37	0.80	0.88	0.89	0.79	0.85
0.49	0.62	0.60	0.58	0.50	0.60	0.58	0.50	0.61	0.45	0.33
0.86	0.84	0.74	0.58	0.51	0.39	0.73	0.92	0.91	0.49	0.74
0.96	0.67	0.54	0.85	0.48	0.37	0.88	0.90	0.94	0.82	0.93
0.69	0.49	0.56	0.66	0.43	0.42	0.77	0.73	0.71	0.90	0.99
0.79	0.73	0.90	0.67	0.33	0.61	0.69	0.79	0.73	0.93	0.97
0.91	0.94	0.89	0.49	0.41	0.78	0.78	0.77	0.89	0.99	0.93

# The plight of the poor pixel

- A pixel's brightness is determined by
  - Light source (strength, direction, color)
  - Surface orientation
  - Surface material and albedo
  - Reflected light and shadows from surrounding surfaces
  - Gain on the sensor
- A pixel's brightness tells us nothing by itself





# And yet we can interpret images...



- Key idea: for nearby scene points, most factors do not change much
- The information is mainly contained in *local differences* of brightness

Darkness = Large Difference in Neighboring Pixels





# What is this?





# What differences in intensity tell us about shape

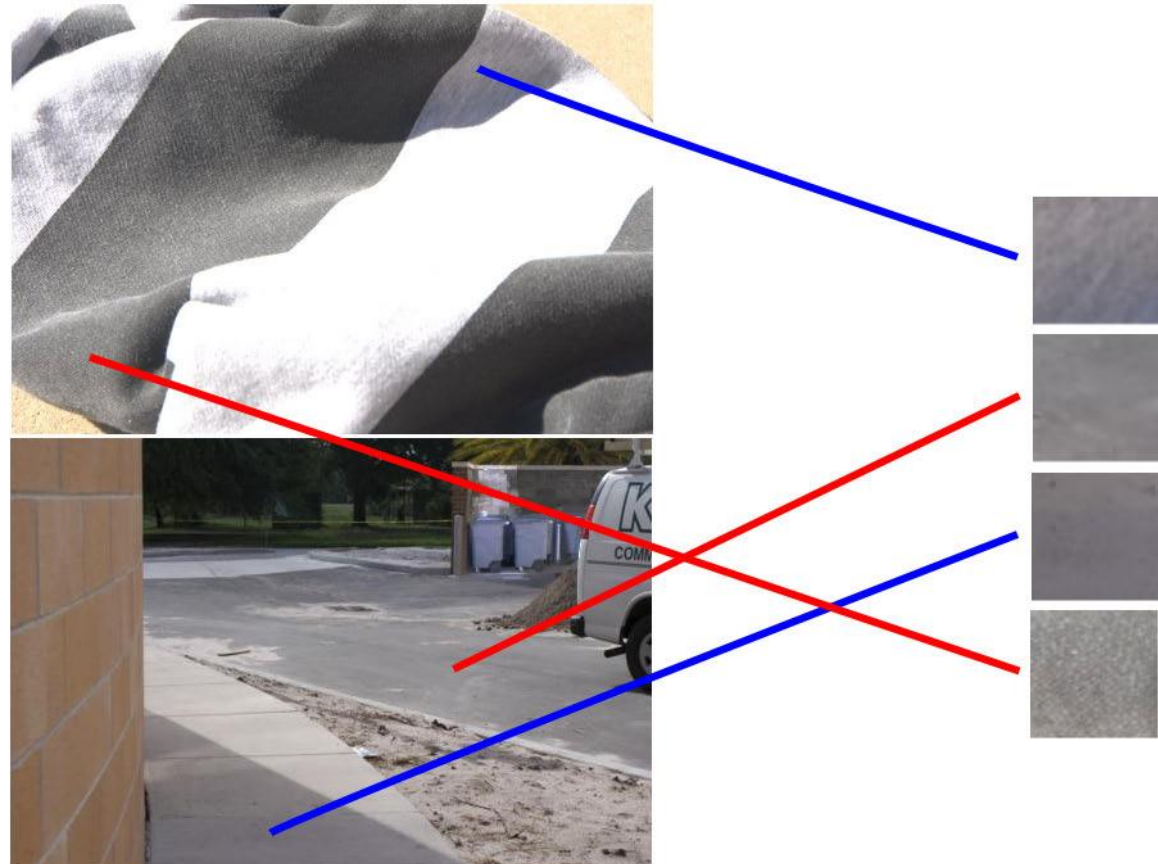
- Changes in surface normal
- Texture
- Proximity
- Indents and bumps
- Grooves and creases





# Color constancy

- Interpret surface in terms of albedo or “true color”, rather than observed intensity
  - Humans are good at it
  - Computers are not nearly as good



# Color Correction

- Simple idea: multiply R, G, and B values by separate constants

$$\begin{bmatrix} \tilde{r} \\ \tilde{g} \\ \tilde{b} \end{bmatrix} = \begin{bmatrix} \alpha_r & 0 & 0 \\ 0 & \alpha_g & 0 \\ 0 & 0 & \alpha_b \end{bmatrix} \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

- How to choose the constants?
  - “White world” assumption: brightest pixel is white
    - Divide by largest value
  - “Gray world” assumption: average value should be gray
    - E.g., multiply r channel by  $\text{avg}(r) / \text{avg}((r+g+b)/3)$
  - White balancing: choose a reference as the white or gray color

# Things to remember

- Important terms: diffuse/specular reflectance, albedo, umbra/penumbra
- Observed intensity depends on light sources, geometry/material of reflecting surface, surrounding objects, camera settings
- Objects cast light and shadows on each other
- Differences in intensity are primary cues for shape

