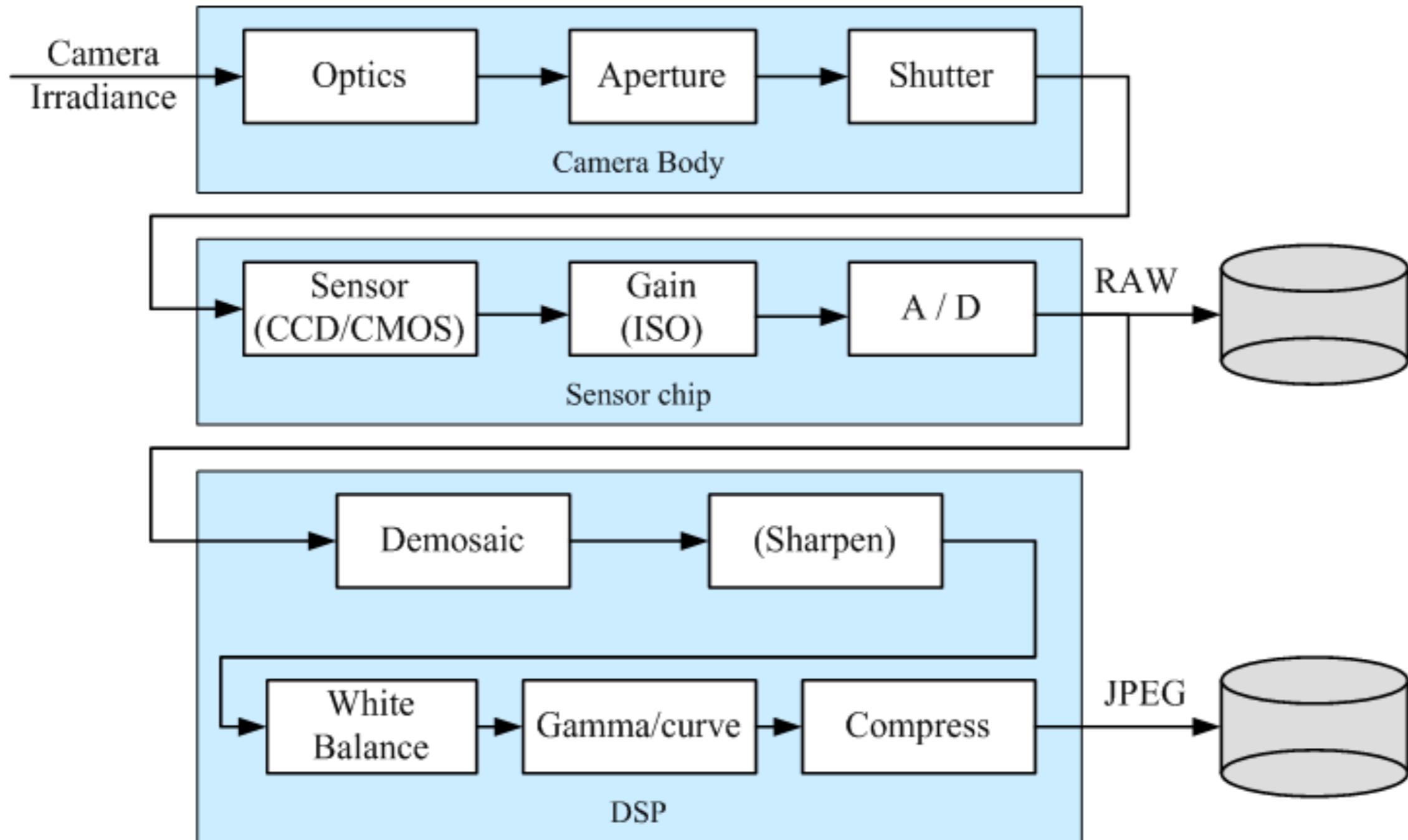


## 2.3 The Digital Camera

# Image Sensing Pipeline (Simplified)



# Outline

- ❖ The Sensor
- ❖ Sampling & Aliasing
- ❖ Colour Coding

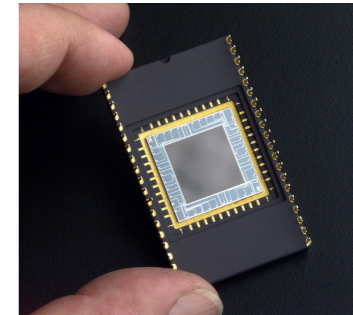
# Outline

- ❖ **The Sensor**
- ❖ Sampling & Aliasing
- ❖ Colour Coding

# Sensor

## ❖ CCD (Charge-Coupled Device)

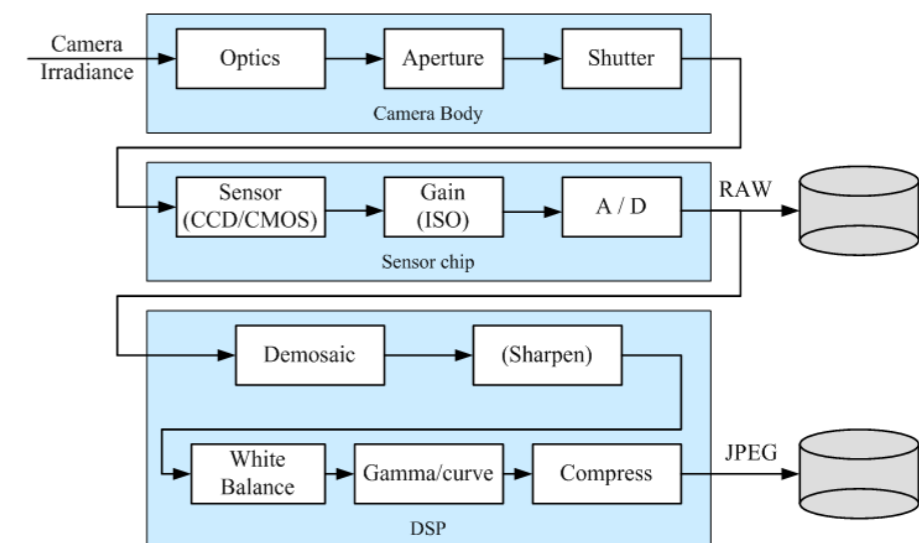
- Photons accumulated in each active well.
- Then charge transferred from well to well (“bucket brigade”) until deposited at sense amplifiers



## ❖ CMOS (Complementary Metal Oxide Semiconductors)

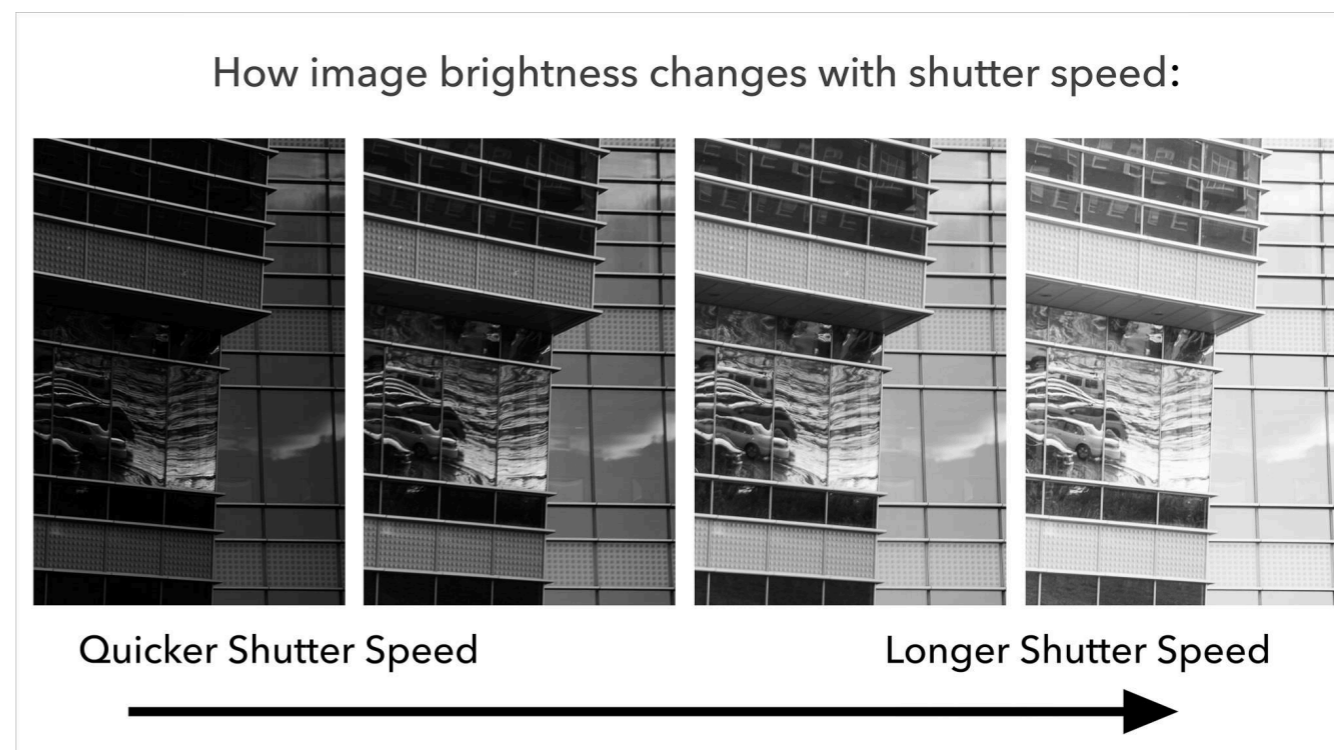
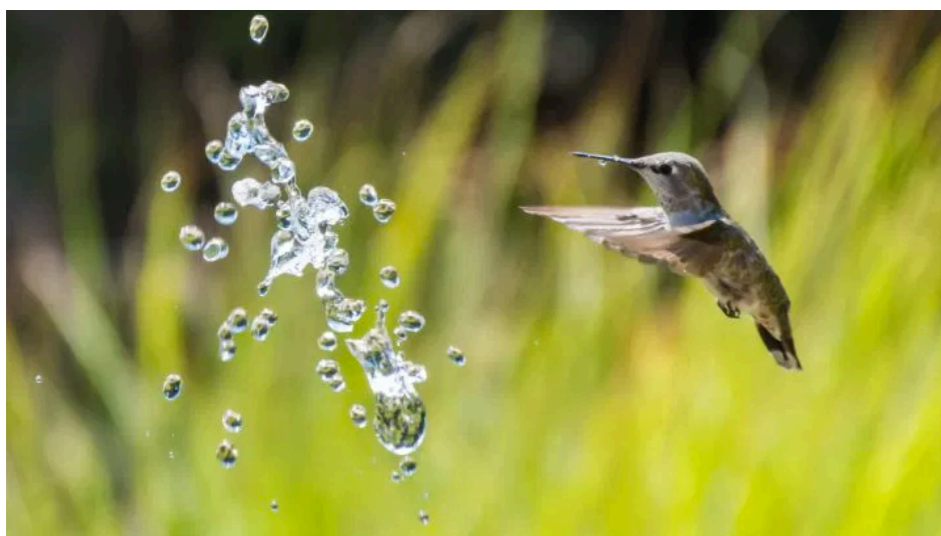
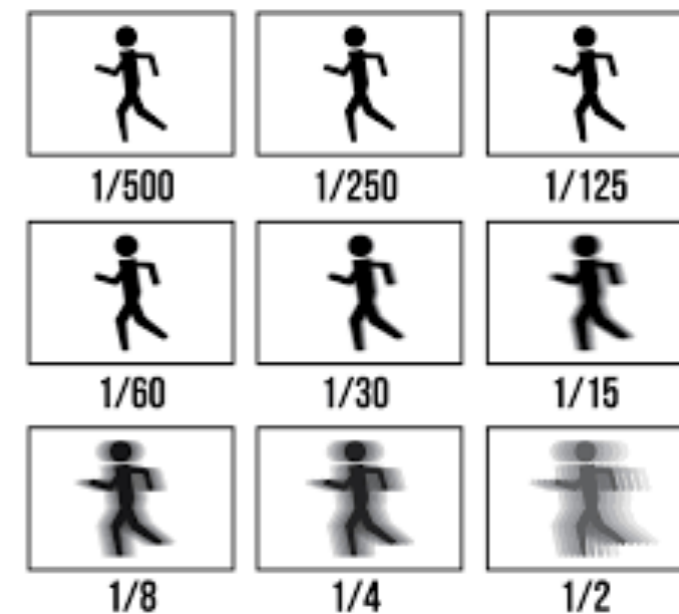
- photons directly affect conductivity of a photodetector
- Each photodetector can be selectively gated and amplified
- Read out using multiplexing scheme

## ❖ Most digital cameras now use CMOS.



# Shutter Speed

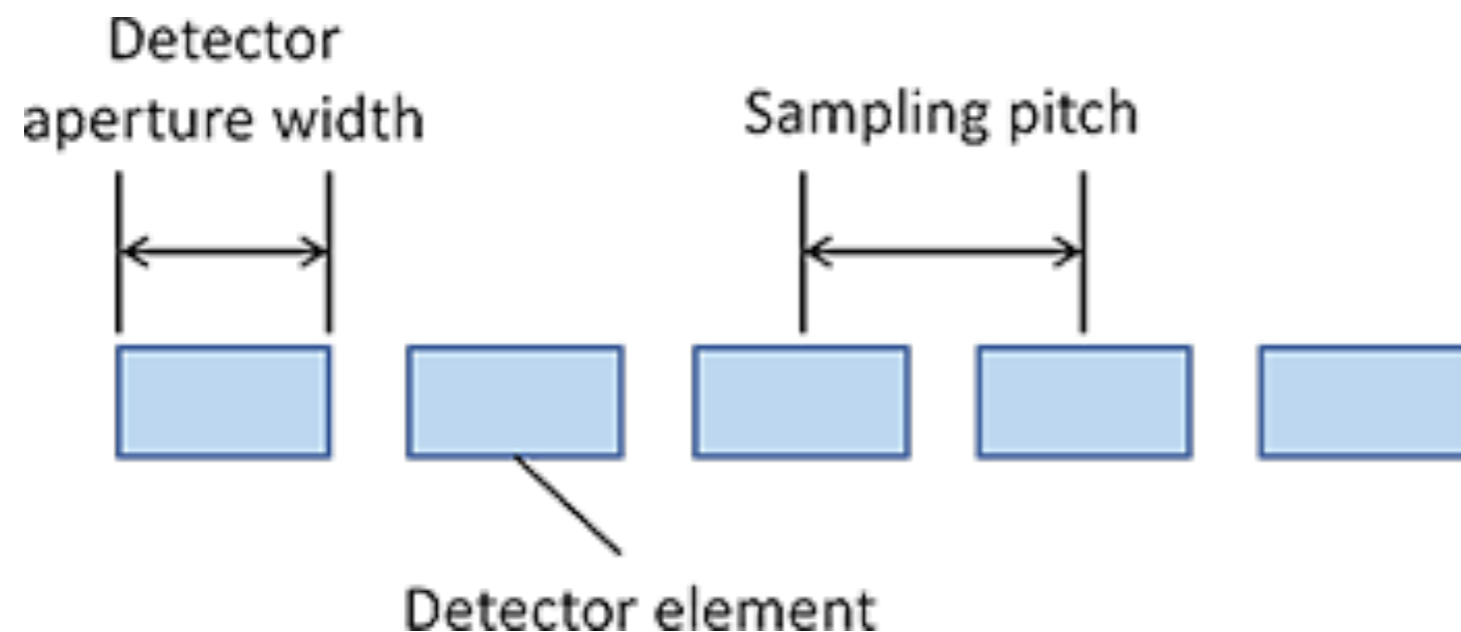
- ❖ Measured in fractions of a second (e.g., 1/125, 1/60, 1/30,...)
- ❖ Controls the amount of light integrated by the sensor
- ❖ Faster shutter speeds prevent ‘camera shake’ and reduce motion blur but will be noisier unless scene is well illuminated.
- ❖ Need to use a tripod for slower shutter speeds!



# Sampling Pitch & Fill Factor

- ❖ Sampling pitch is the physical spacing between adjacent sensor cells.
- ❖ For a fixed chip size, smaller pitch means higher resolution (good!) but less light per pixel (bad!)

$$\text{Fill factor} \simeq \frac{\text{Detector aperture width}}{\text{Sampling pitch}}$$



# Chip Size

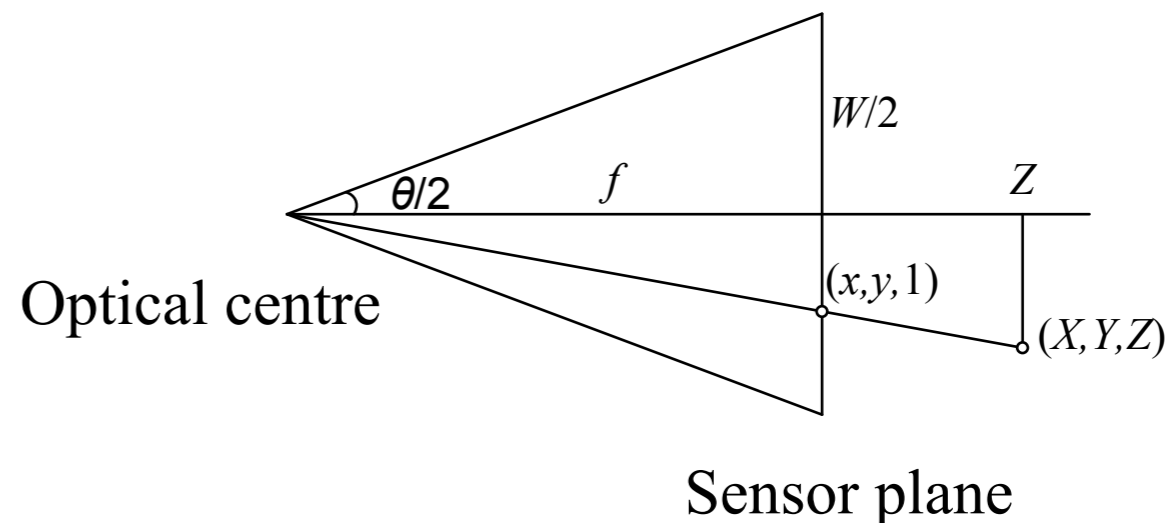
- ❖ Chip widths can vary from around  $\sim 1/4''$  to  $\sim 1.1''$
- ❖ Generally this is less than the 35mm width of a standard film frame.
- ❖ Our understanding of focal lengths (e.g., a standard 50mm lens) is based on using 35mm film
- ❖ To adapt this to a digital camera we must scale by the ratio of the sensor widths.



# Focal Lengths

- ❖ Focal length can be measured either in pixels or in mm.

$$\tan \frac{\theta}{2} = \frac{W}{2f} \quad \text{or} \quad f = \frac{W}{2} \left[ \tan \frac{\theta}{2} \right]^{-1}$$



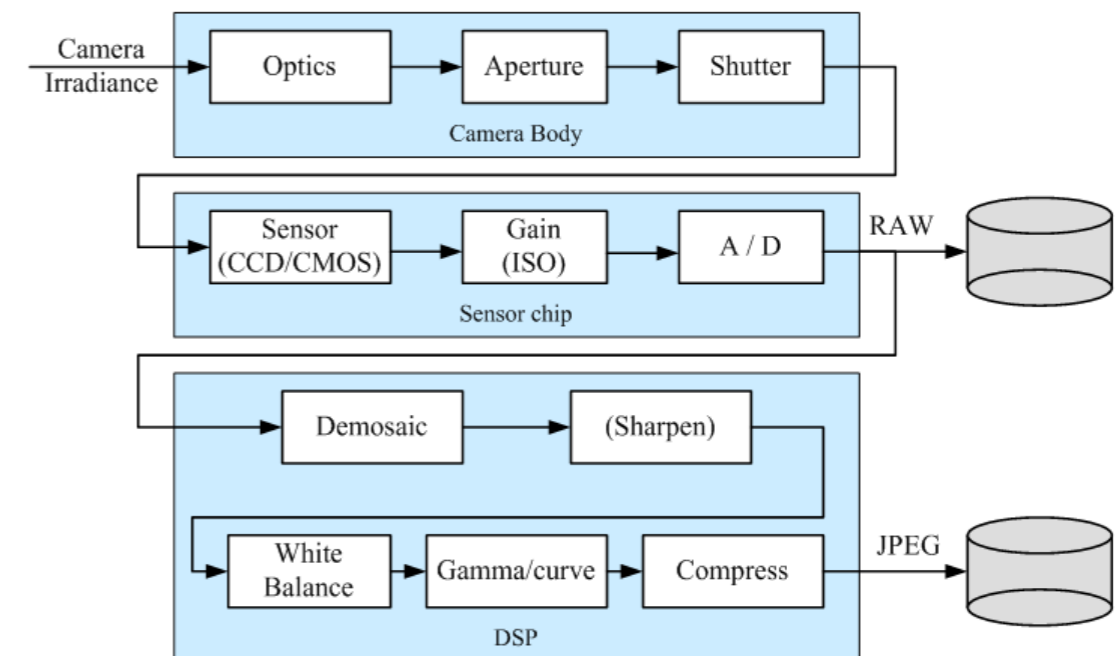
- ❖ Example: What focal length would give me the equivalent of a 50mm lens for the FLIR BlackFly S BFS-PGE-122S6C-C?

- ❖ Sensor width: 1.1" = 27.94mm



# Analog Gain

- ❖ May be controlled through automatic gain control logic
- ❖ Can also be adjusted through ISO setting
- ❖ Higher gain allows faster shutter speeds (less motion blur) and/or smaller apertures (greater depth of field).
- ❖ But at the expense of higher sensor noise!



# Sensor Noise

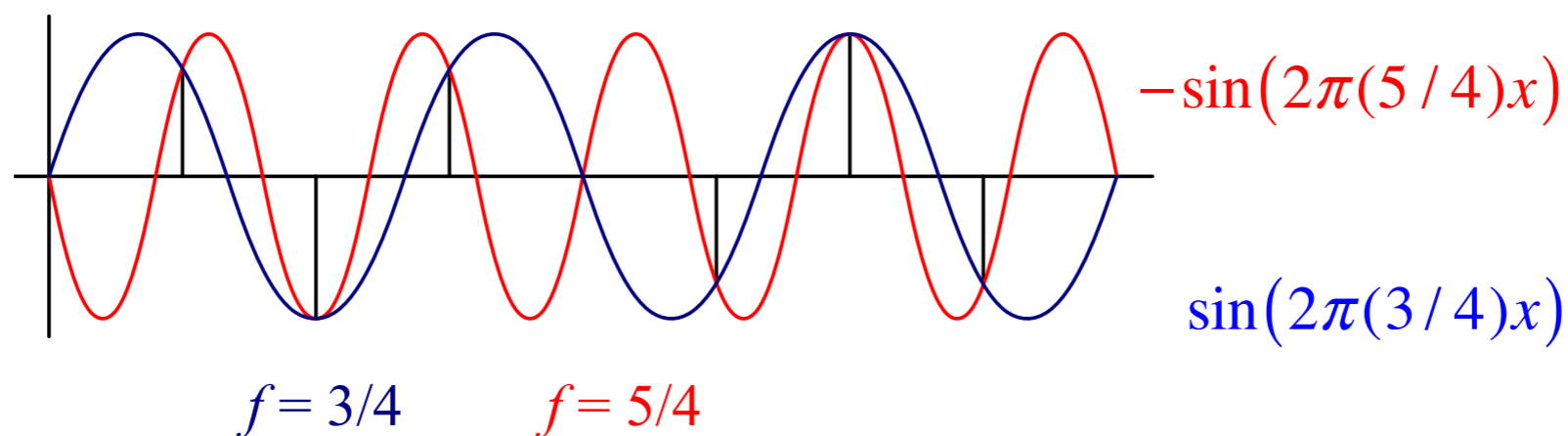
- ❖ May include
  - fixed pattern noise
  - dark current noise
  - shot noise
  - amplifier noise
  - quantization noise
- ❖ Increases with sensor gain
- ❖ Can be estimated (Assignment 1) by
  - Measuring variability when irradiance is constant
  - Differencing two images taken in rapid succession

# Outline

- ❖ The Sensor
- ❖ **Sampling & Aliasing**
- ❖ Colour Coding

# Sampling & Aliasing

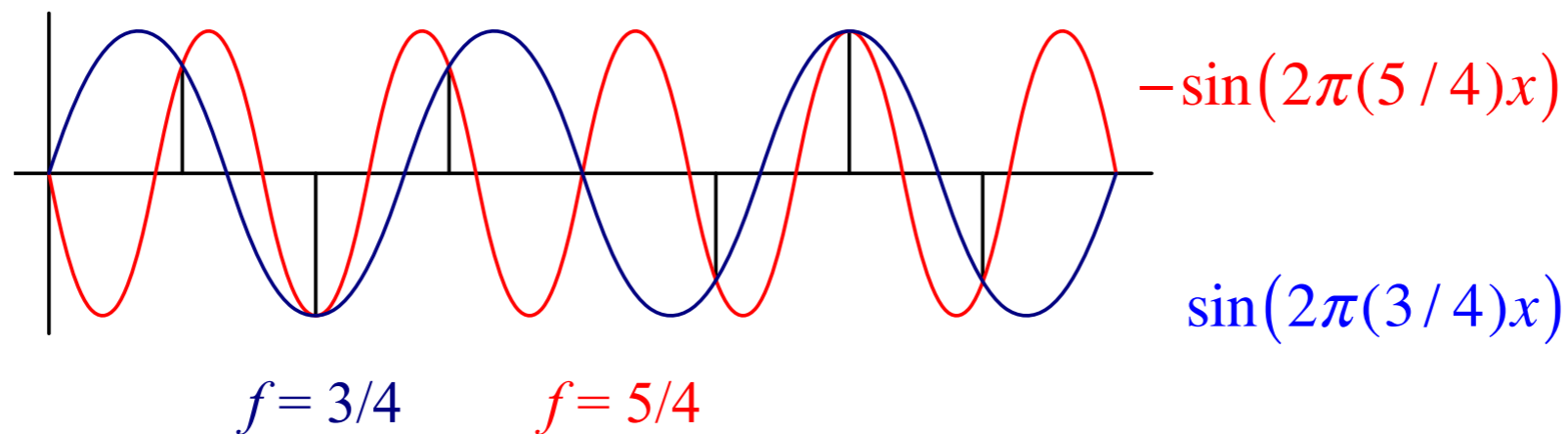
- ❖ The optical signal is continuous, containing arbitrarily high spatial frequencies.
- ❖ The sensor is spatially sampling this signal at discrete locations determined by the sampling pitch.
- ❖ If the image is not low-pass filtered, *aliasing* will result: high frequency content will be inextricably mixed with low frequency content in the digital image.
- ❖ Example: sampling rate  $f_s = 2$



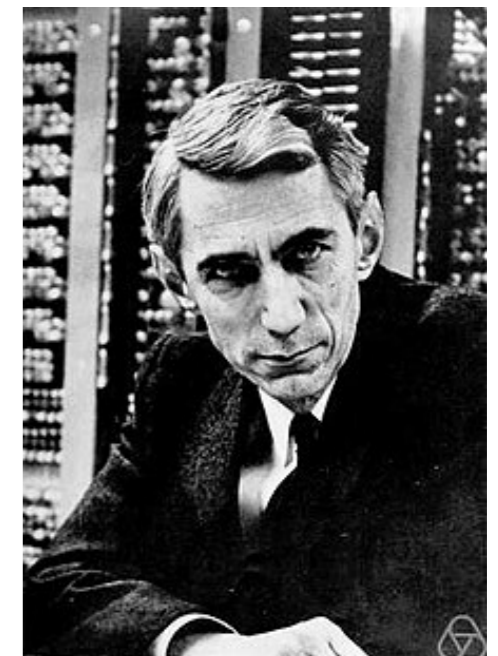
# Nyquist Limit

- ❖ Shannon's sampling theorem: sampling rate must be at least twice the maximum frequency in the signal.

$$f_s \geq 2f_{\max}$$



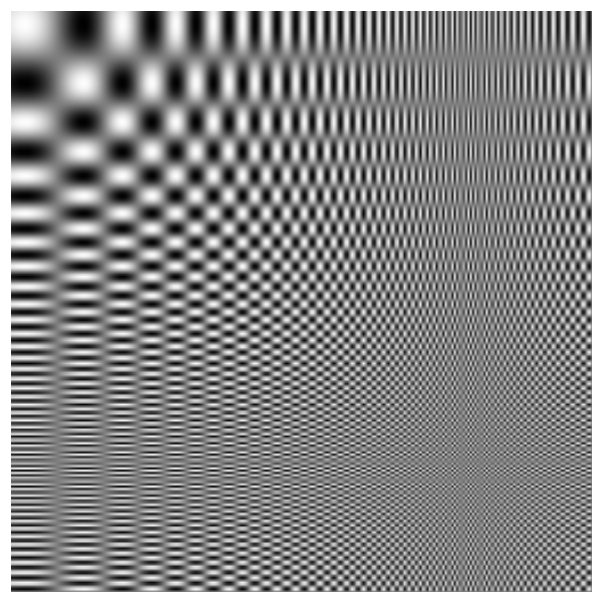
Harry Nyquist (1889 - 1976)



Claude Shannon (1916 - 2001)

# Effect of the Fill Factor

- ❖ Each pixel is actually the result of integrating light over a small square, the size of which is determined by the sampling pitch and fill factor.
- ❖ This serves to attenuate high frequencies.
- ❖ However, the Fourier transform of this ‘boxcar’ filter falls only as  $1/f$ , and thus high frequencies, while attenuated, are still present and cause aliasing.



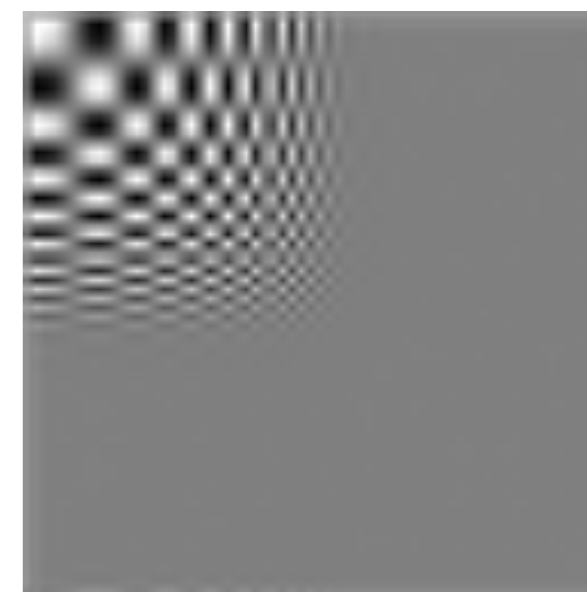
Original Image



Boxcar with 25% fill factor



Boxcar with 100% fill factor



High-quality lowpass filter

Subsampled by a factor of 4

# Point Spread Function (PSF)

- ❖ The pre-filtering of the optical signal is determined by:
  - ⦿ The optical system (diffraction, focal blur)
  - ⦿ The integration area (sampling pitch and fill factor)
  - ⦿ Integrated optical anti-aliasing filters
- ❖ If together these filters adequately attenuate frequencies above the Nyquist limit, visible aliasing will be minimal.



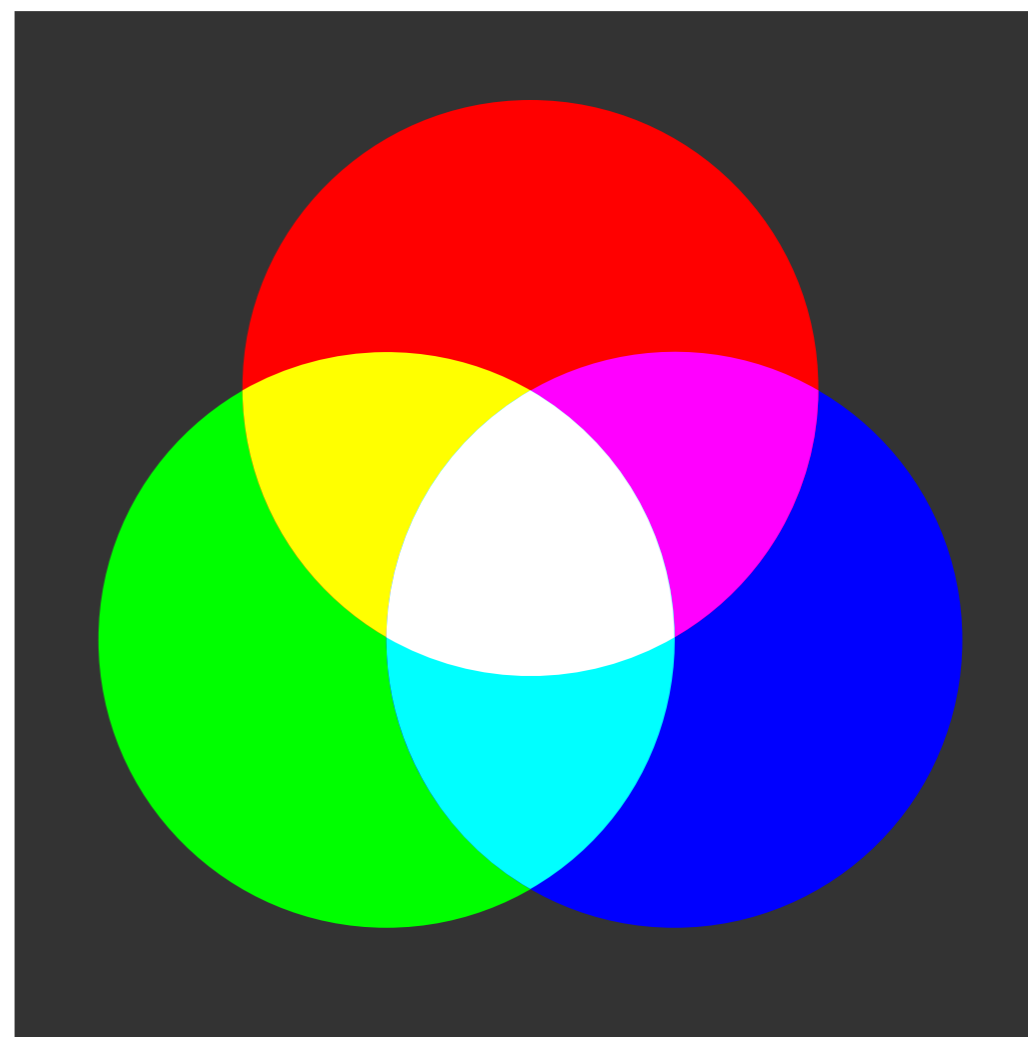
# End of Lecture Sept 19, 2018

# Outline

- ❖ The Sensor
- ❖ Sampling & Aliasing
- ❖ **Colour Coding**

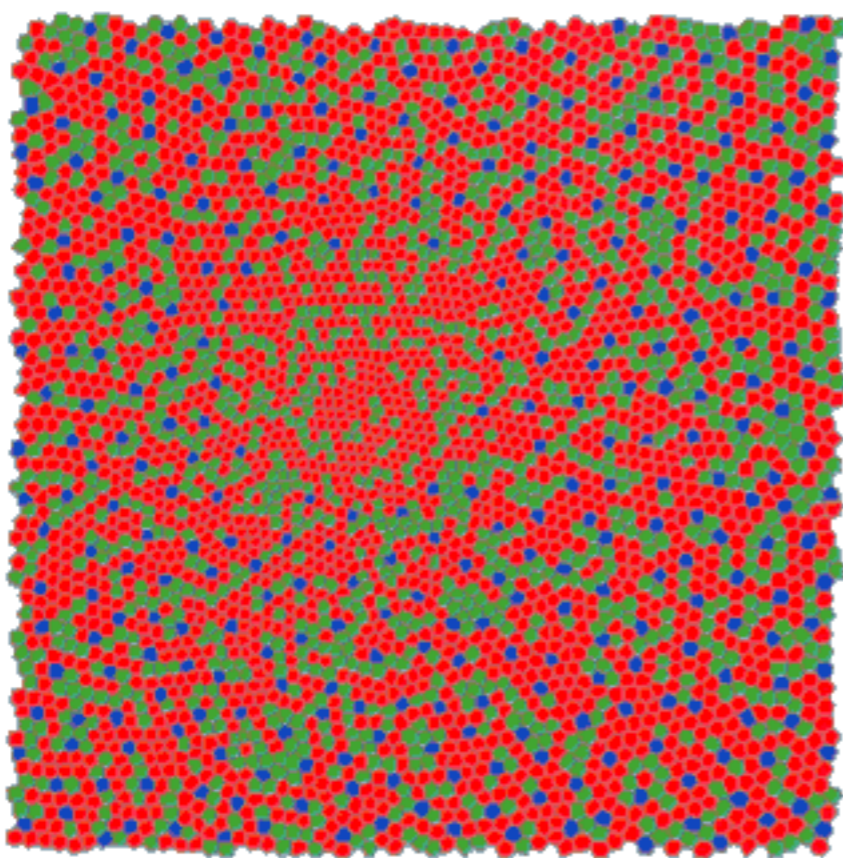
# Colour Sampling

- ❖ Natural scenes reflect light rays over a wide continuum of wavelengths.
- ❖ Yet most colour cameras have only 3 discrete types of sensor elements tuned to 3 different colours (wavelengths): red, green and blue.
- ❖ Similarly, most colour displays have 3 distinct types of light-emitting elements, also emitting at red, green and blue wavelengths.
- ❖ Why is this? Why should this be sufficient?

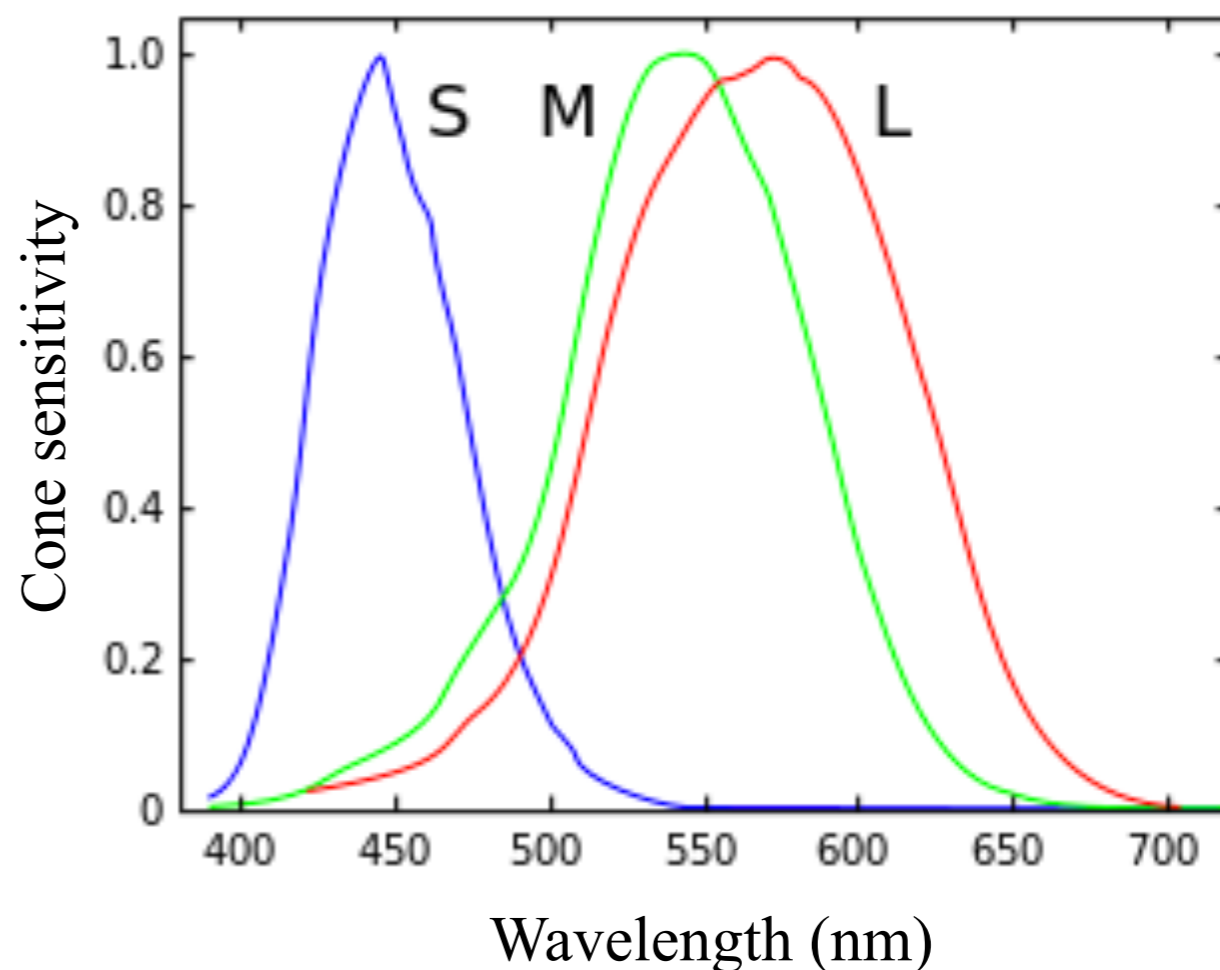


# Trichromacy

- ❖ The human retina has (at most) 3 distinct photoreceptive cone types, each tuned to a specific band of wavelengths.
- ❖ This means that human colour vision is 3-dimensional
- ❖ Any 3 colour vectors that span this 3D space are sufficient to generate the entire space of colours that we experience.

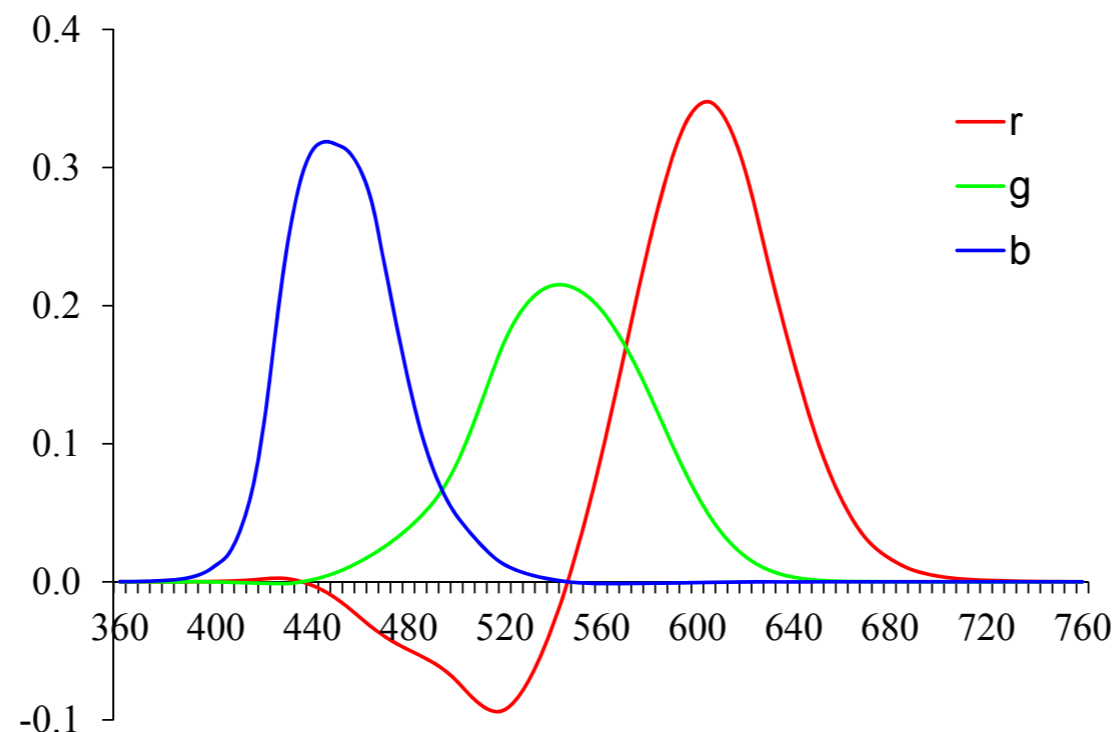


Human cone mosaic



# CIE RGB Representation

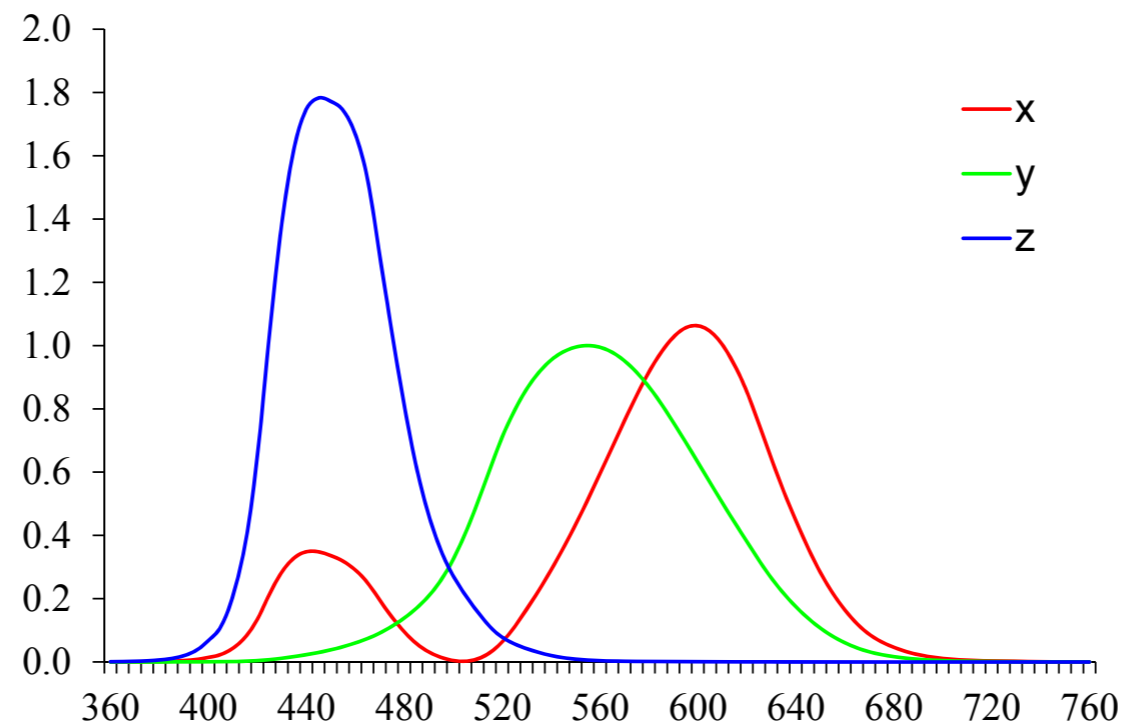
- ❖ Colour representation standard formed in 1931
- ❖ Based on human behavioural colour matching to monochromatic test colours.
- ❖ Subjects adjusted the relative amplitudes of 3 monochromatic primaries:
  - ⦿ Red (700.0nm)
  - ⦿ Green (546.1nm)
  - ⦿ Blue (435.8nm)
- ❖ Note that reproducing pure spectra in the blue-green range requires a negative amount of red light!



# CIE XYZ Representation

- ❖ To avoid this negative light problem, the CIE created a new *XYZ* standard based on a linear transformation of the RGB standard.
- ❖ In the *XYZ* representation, the *Y* channel corresponds to (achromatic) luminance.
- ❖ Note that, unlike the CIE RGB space, the *XYZ* dimensions are ‘imaginary’ primary colours having no physical reality.

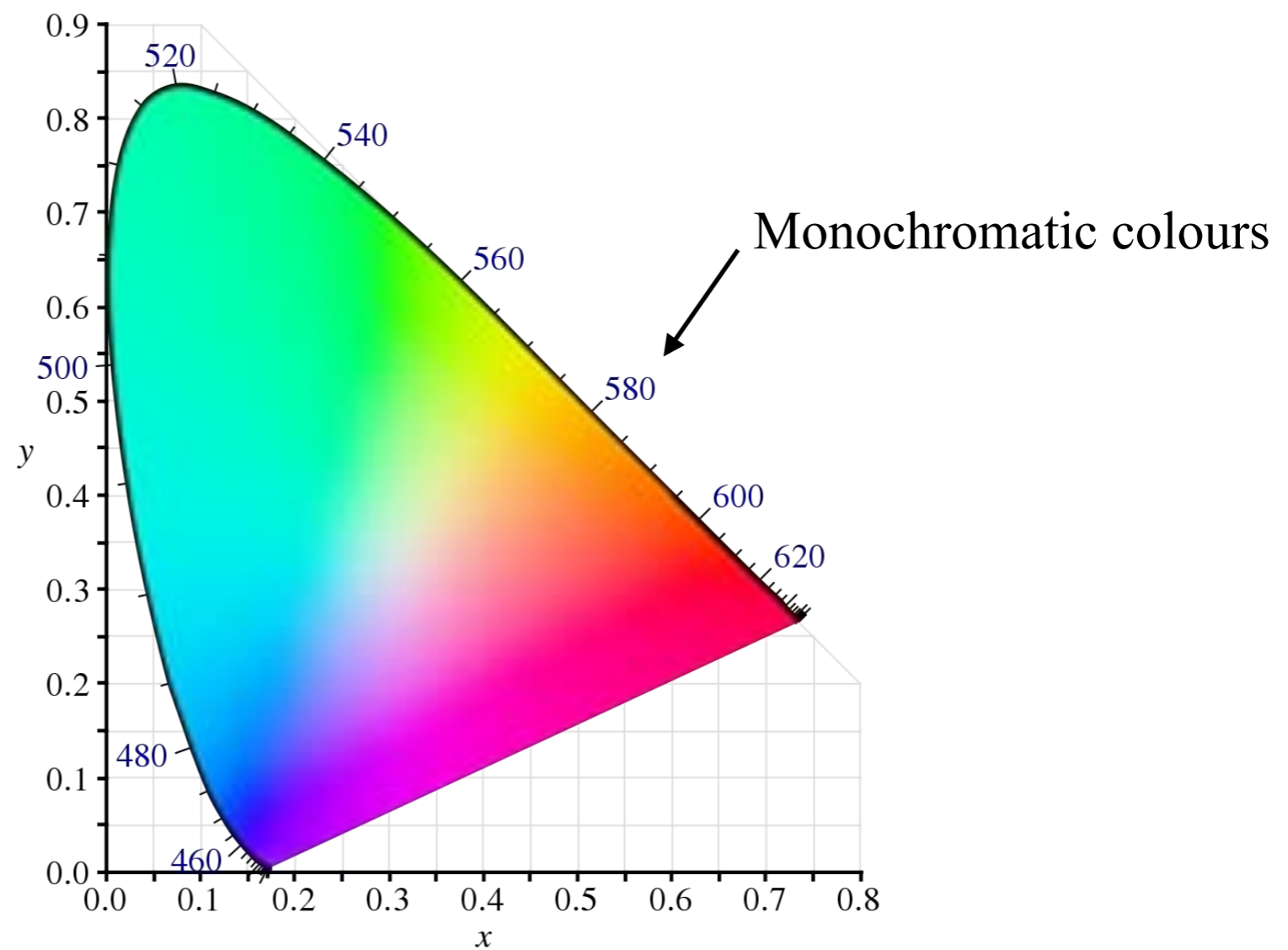
$$\begin{bmatrix} X \\ Y \\ Z \end{bmatrix} = \frac{1}{0.17697} \begin{bmatrix} 0.49 & 0.31 & 0.20 \\ 0.17697 & 0.81240 & 0.01063 \\ 0.00 & 0.01 & 0.99 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$



- In MATLAB:**
- `rgb2xyz(rgb)`
  - `xyz2rgb(xyz)`

# Chromaticity Coordinates

$$x = \frac{X}{X + Y + Z}, \quad y = \frac{Y}{X + Y + Z}, \quad z = \frac{Z}{X + Y + Z}$$



# L\*a\*b\* Space

- ❖ Human luminance/colour sensitivity is roughly logarithmic
  - ⦿ We can perceive relative differences of about 1%.
- ❖ Since XYZ space is linear with the amplitude of the stimulus, it does not predict human perception of colour and luminance differences.
- ❖ L\*a\*b\* space is a nonlinear remapping of XYZ space that renders differences in luminance and chrominance more perceptually uniform.

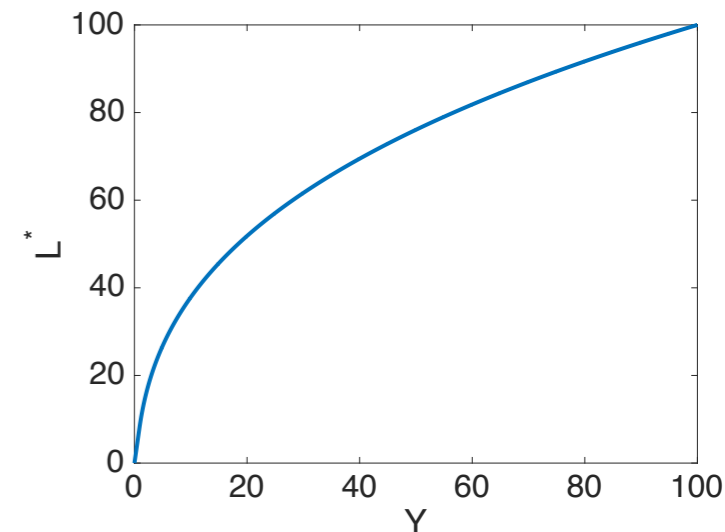
The L\* component of *lightness* is defined as NB: Error in textbook

$$L^* = 116f\left(\frac{Y}{Y_n}\right) - 16$$

where  $Y_n$  is the luminance value for nominal white (Fairchild 2005) and

$$f(t) = \begin{cases} t^{1/3} & t > \delta^3 \\ t/(3\delta^2) + 2\delta/3 & \text{else,} \end{cases}$$

where  $Y_n = 100$ ,  $\delta = 6/29$ .



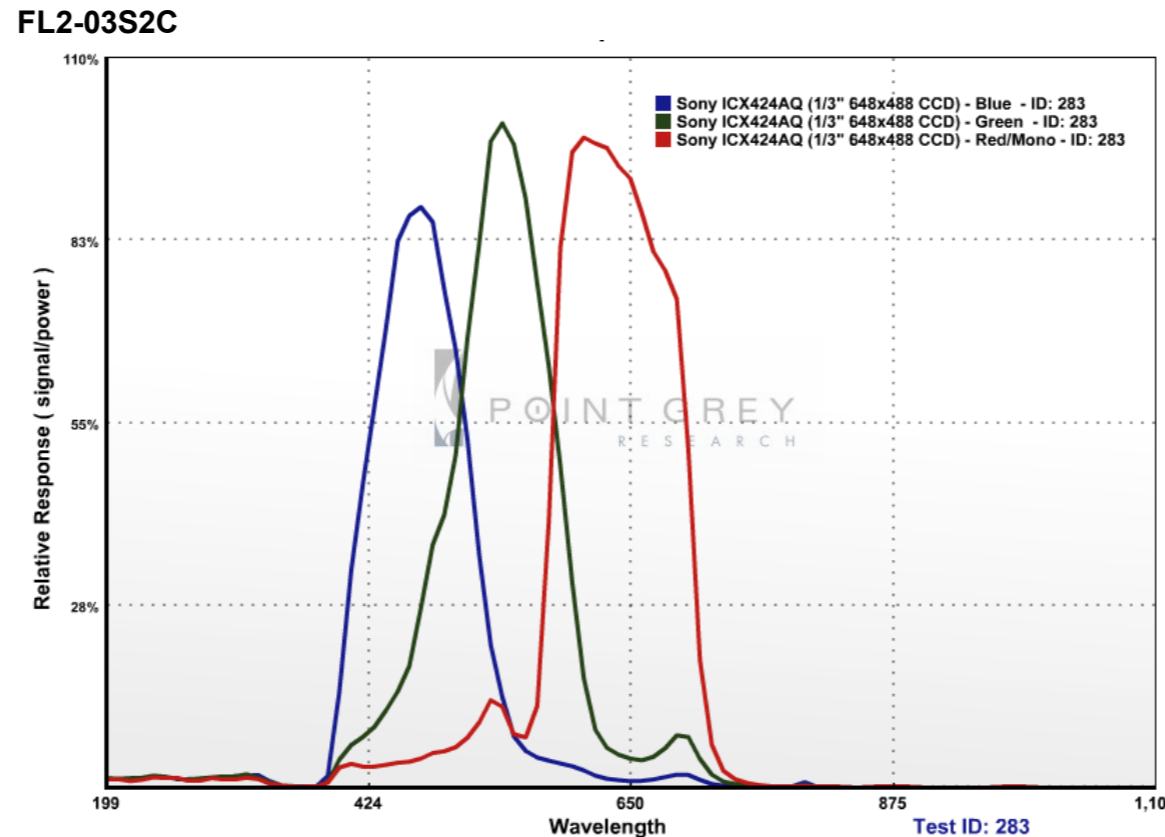
- In MATLAB:**
- `rgb2lab(rgb)`
  - `lab2rgb(lab)`
  - `xyz2lab(xyz)`
  - `lab2xyz(lab)`



# Colour Cameras

- ❖ Spectral sensitivities vary from camera to camera.
- ❖ It's the job of the camera firmware to convert these proprietary sensor responses to standard colour values.
- ❖ For some professional and scientific cameras, the manufacturer provides the spectral responses.

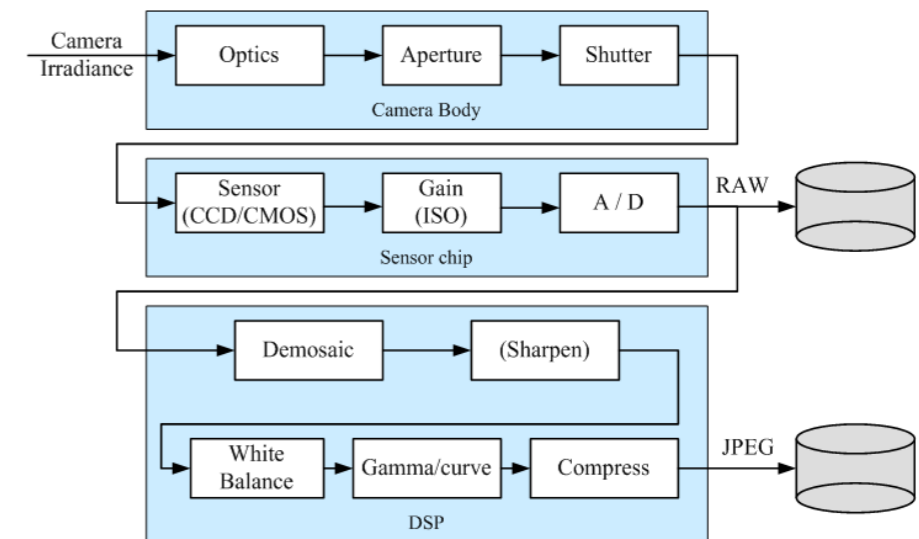
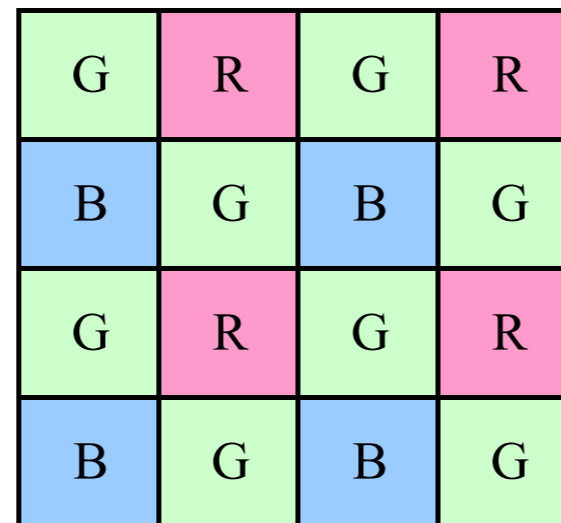
Spectral response curves for Point Grey Flea2



# Colour Filter Arrays

- ❖ Colour camera sensors consist of a mosaic of sensing elements covered by different coloured filters.
- ❖ The most common design is the Bayer pattern, consisting of

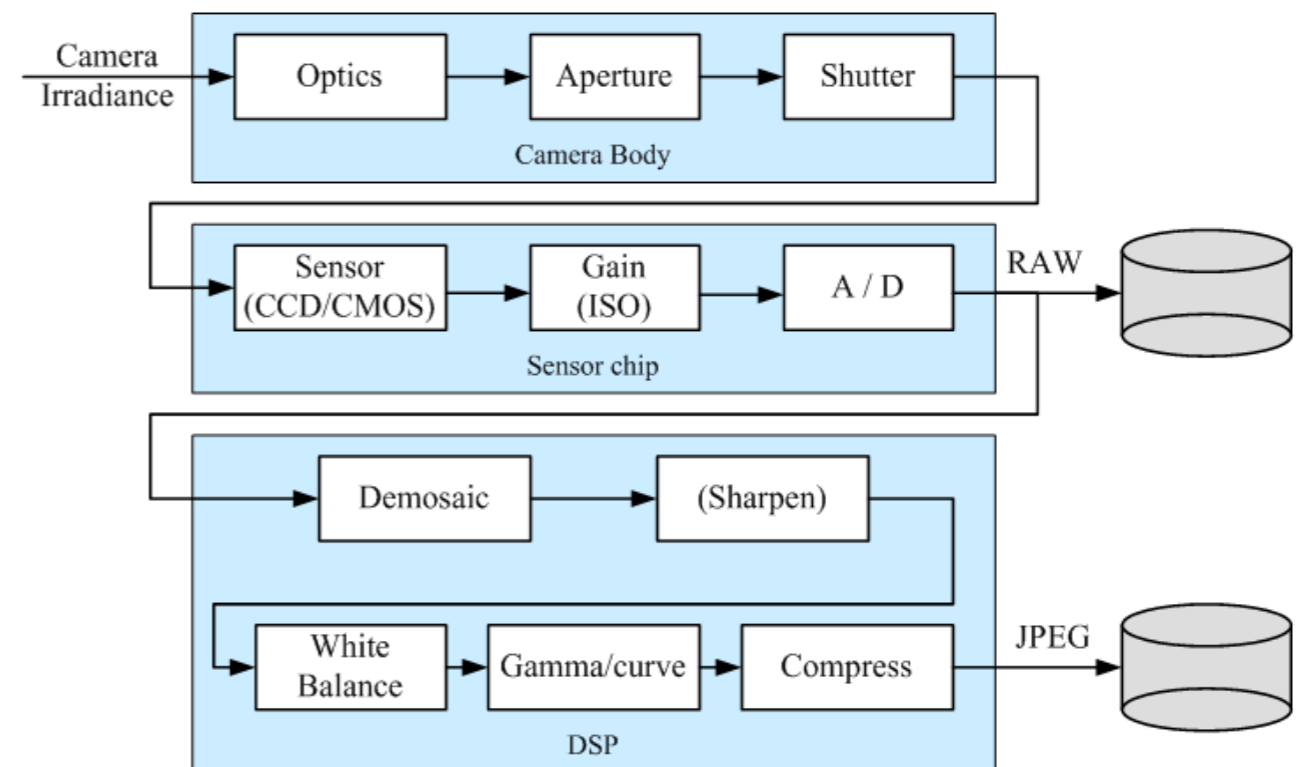
- 25% red
- 50% green
- 25% blue



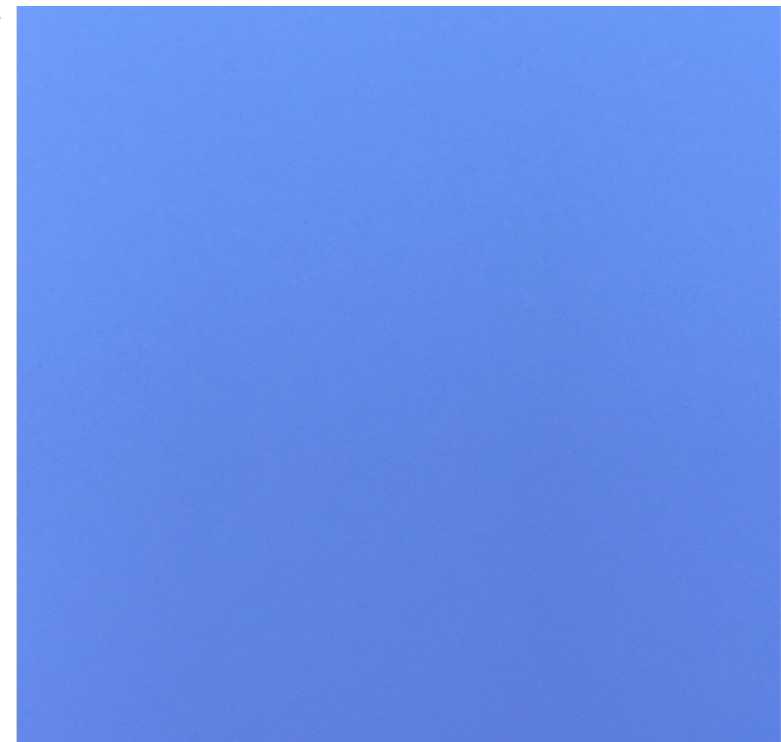
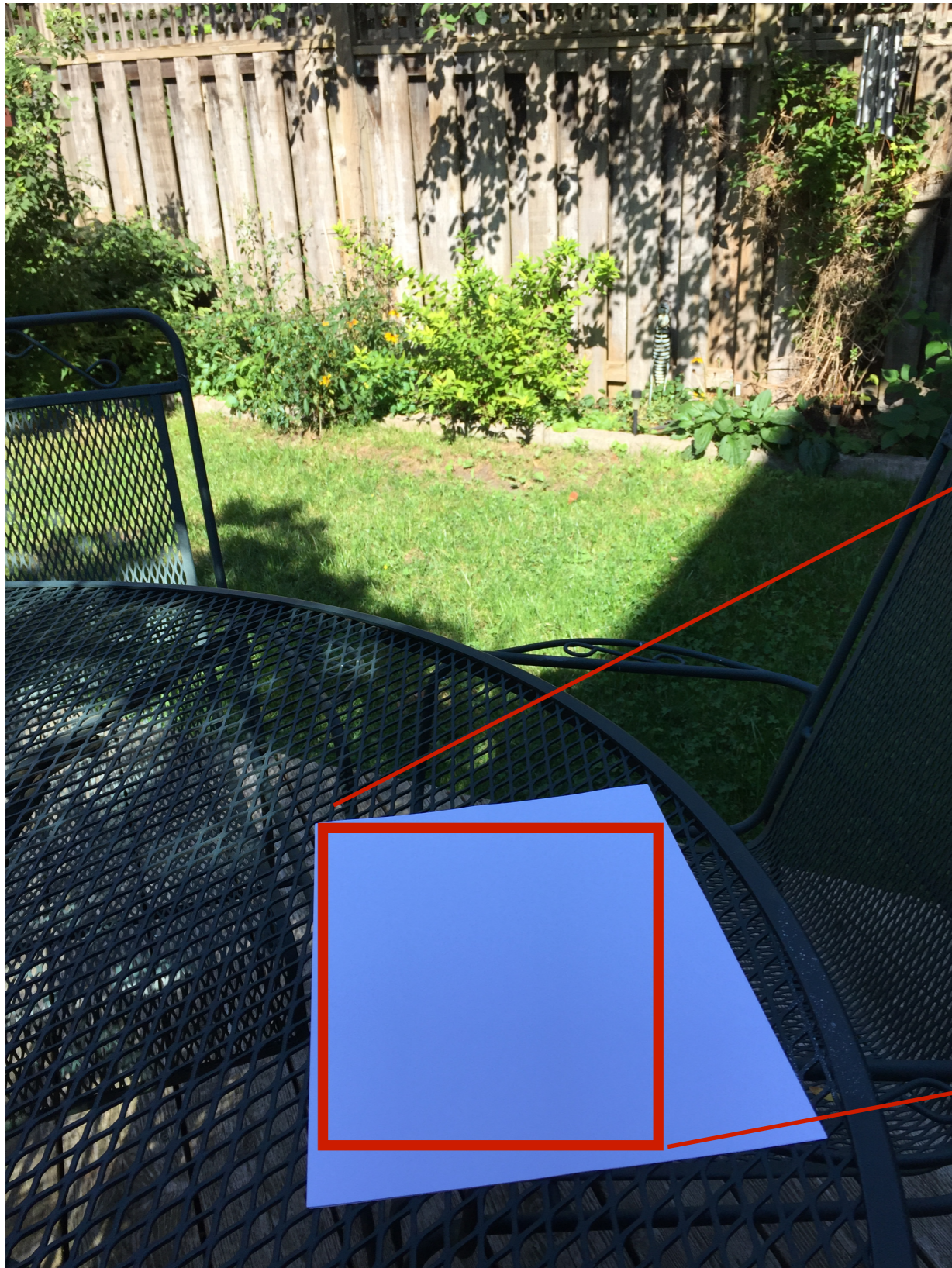
- ❖ The greater density of green elements reflects the fact that
  - perceived luminance depends primarily on the green channel
  - visual acuity is far greater for luminance than colour
- ❖ Interpolation of missing colour values at each pixel known as *demosaicing*.

# White Balance

- ❖ The colour of the irradiance received from a surface depends upon both the colour of the surface material and the colour of the illuminant.
- ❖ Standard colour systems assume a specific illuminant (e.g., daylight)
- ❖ If the illuminant deviates from this standard, the resulting photo (out of context) may look oddly coloured.
- ❖ White balance is an attempt to reduce this effect by moving the white point of the image closer to pure white (equal RGB values).
- ❖ Can achieve this by scaling the R, G and B values by different amounts (Assignment 1).

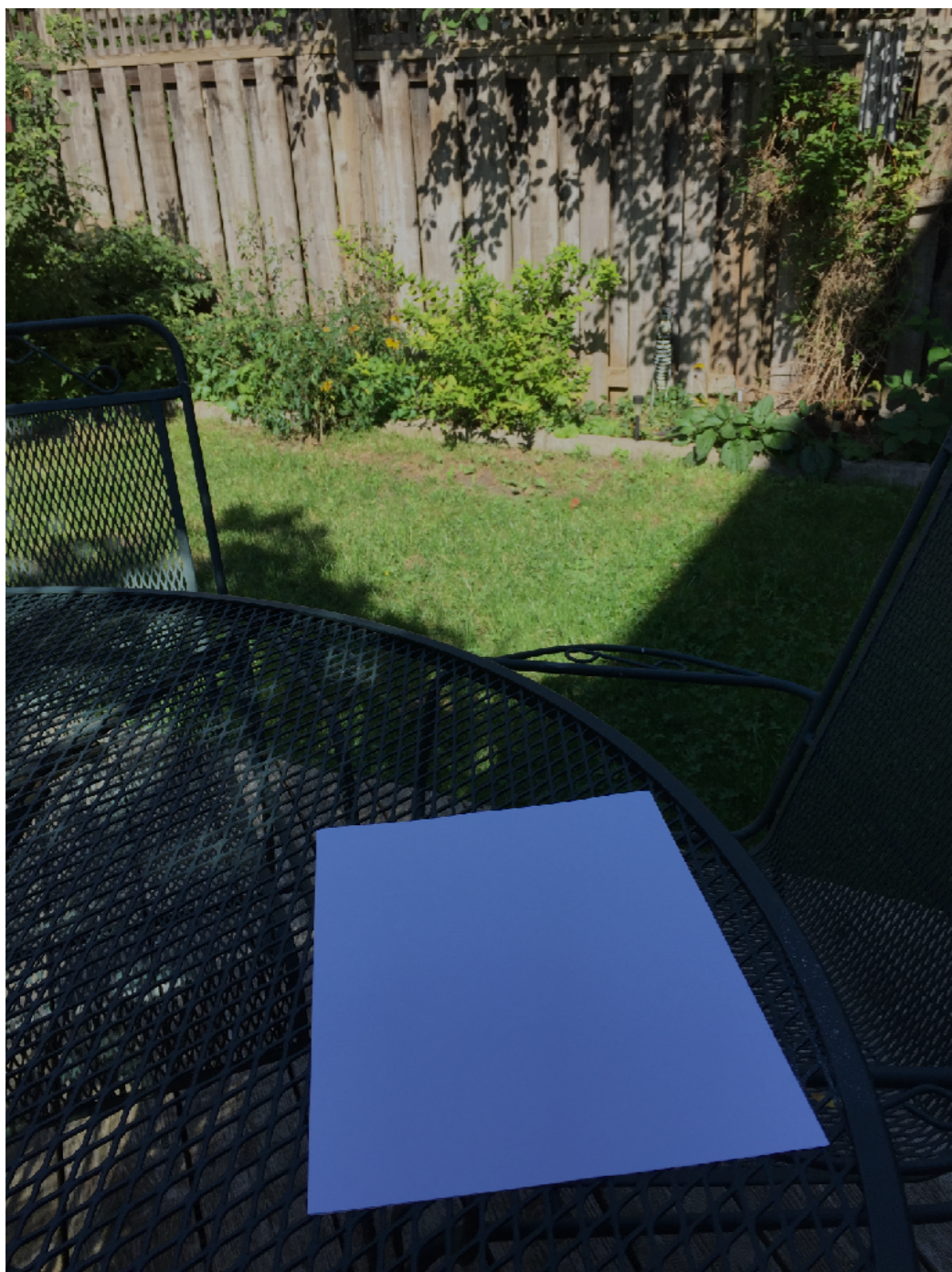


# White Balance Example

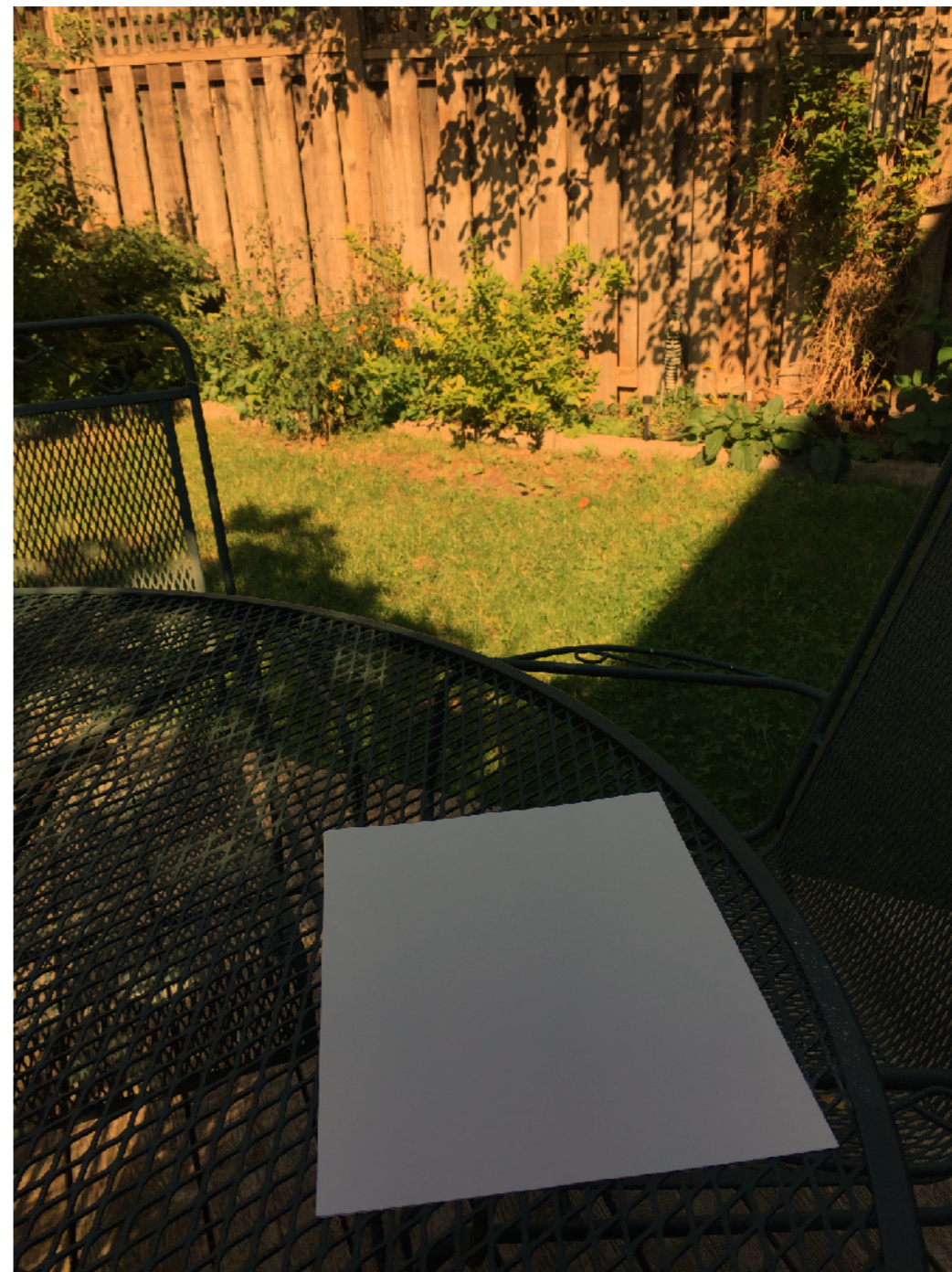


# White Balance Results

## Original



## White Balanced



# Gamma

- ❖ Cameras typically compress the intensity (luminance) of pixel values through an inverse ‘gamma function’:

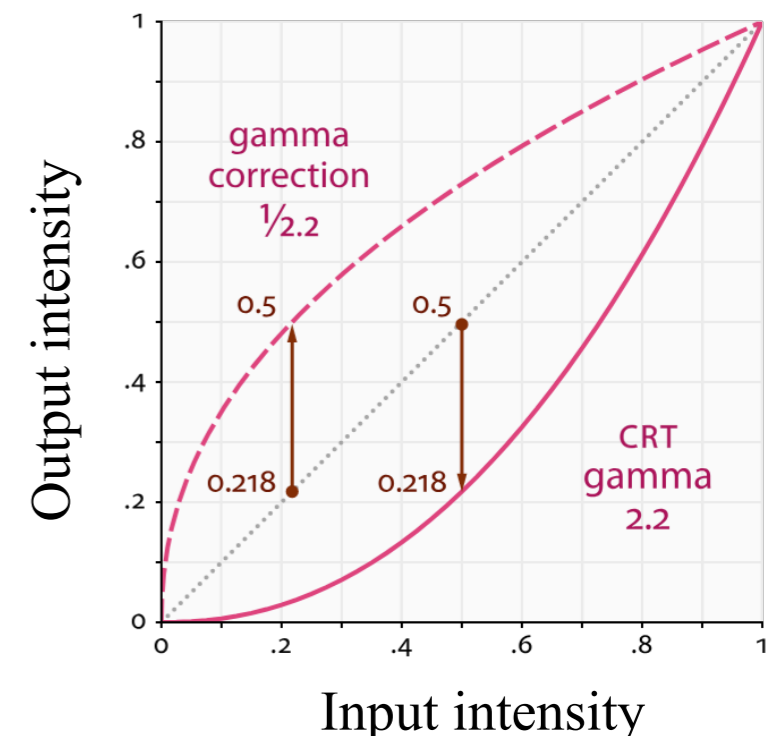
$$Y' = Y^{\frac{1}{\gamma}}$$

where  $\gamma \approx 2.2$ .

- ❖ This roughly cancels the gamma function applied to RGB values by display systems prior to rendering:

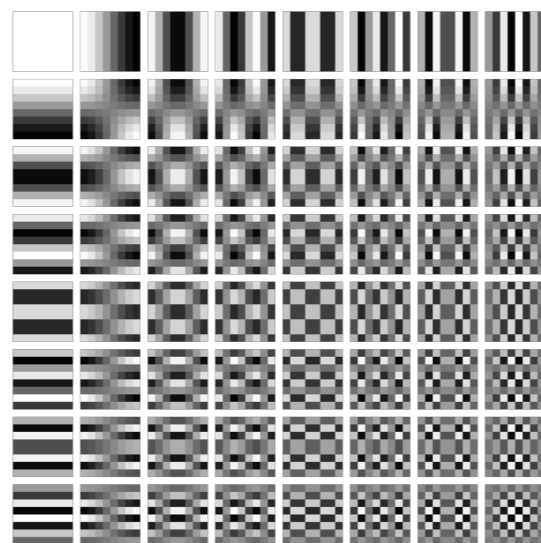
$$B = V^{\gamma}$$

- ❖ However the nonlinear relationship between encoded RGB values and physical intensities complicates physics-based computer vision algorithms, which often assume access to linear luminance values.



# Compression

- ❖ All compression algorithms start by separating luma and chroma channels so that luma can be encoded with higher fidelity.
- ❖ Block transform stage then breaks image into disjoint blocks (e.g., 8 x 8 pixels) and codes each using a discrete cosine transform (DCT), which approximates an efficient coding (principal components) strategy.
- ❖ Resulting DCT coefficients then coded using a variation of Huffman coding.
- ❖ Video coding uses predictive (difference) encoding between frames, compensating for estimated motion in the image.



DCT Basis Functions

# Outline

- ❖ The Sensor
- ❖ Sampling & Aliasing
- ❖ Colour Coding