

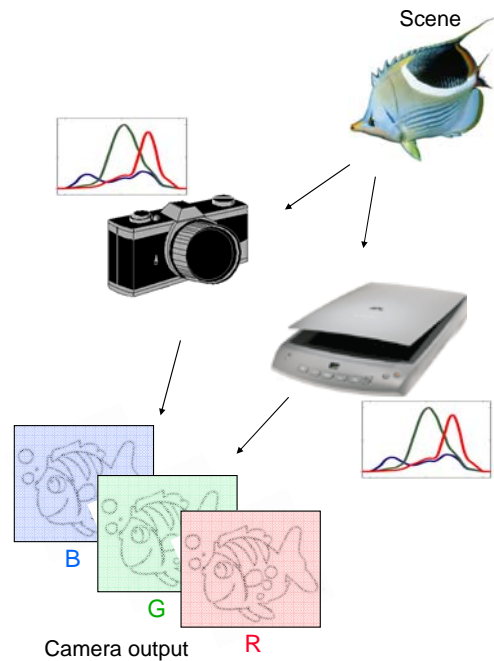
Lecture 7

Acquisition Devices

Optics
Sensors
Scanners
Digital Cameras
CCD Arrays vs CMOS
Applications: Camera calibration
Gamma Insertion
Color Correction
Demosaicing



Acquisition Devices



Acquisition Devices

Two components:

Optics: Lens, zoom motor, shutter.



Sensors: CCD, acquisition pipeline

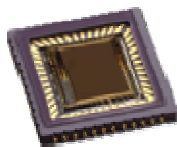
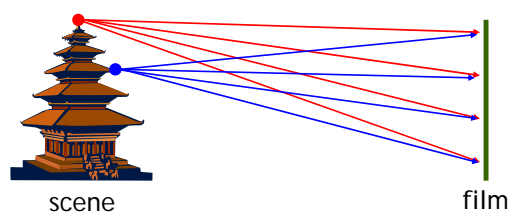
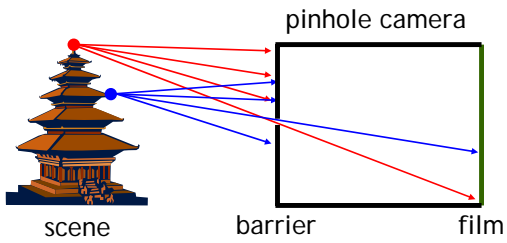


Image Formation - Optics



Put a piece of film in front of an object.

Image Formation - Optics

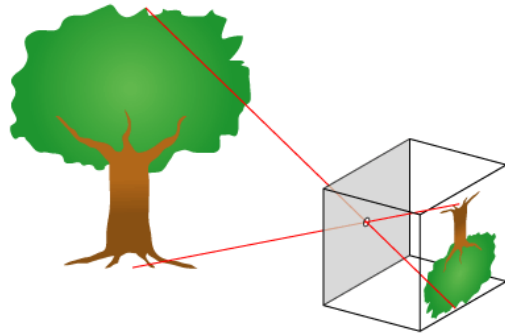


Add a barrier to block off most of the rays.

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

source: Yung-Yu Chuang

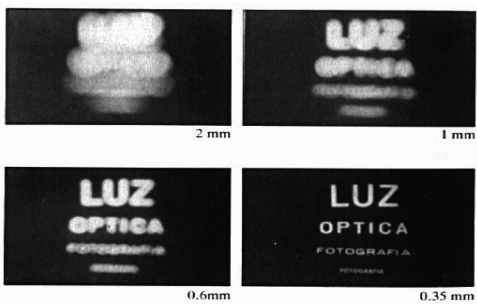
Pinhole camera



The image is inverted

Image Formation - Optics

Shrinking the aperture

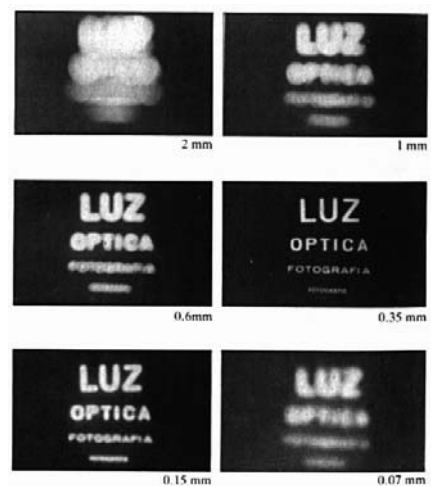


Why not create the aperture as small as possible?

- Less light gets through
- Diffraction effect

Image Formation - Optics

Shrinking the aperture



High-end commercial pinhole cameras



Robert Rigby 8x4 Pinhole Camera



© 2002 HEIDI CRABBE

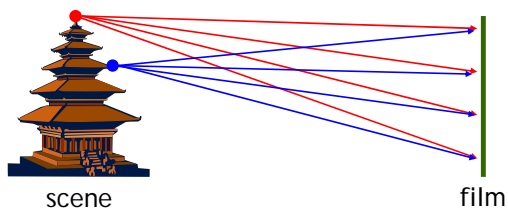
Pinhole Images



Exposure 96 minutes

Images copyright © 2000 Zero Image Co.

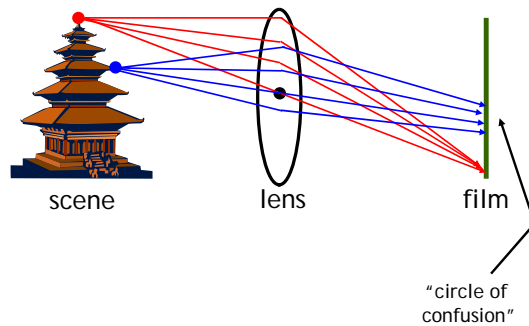
Image Formation - Optics Adding a Lens



scene

film

Image Formation - Optics Adding a Lens



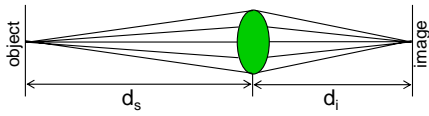
scene

lens

film

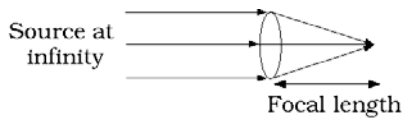
"circle of confusion"

Lensmaker's Equation



$$\frac{1}{d_s} + \frac{1}{d_i} = \frac{1}{f}$$

d_s = source dist
 d_i = image dist
 f = focal length



Source at infinity

Focal length

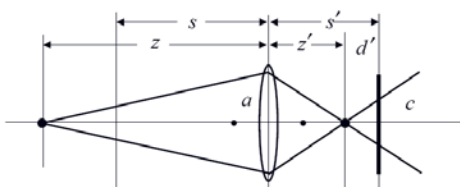
Lens power (diopters) = $\frac{1}{\text{Focal length (m)}}$

In-Focus Out-of-Focus

If sensor plane position and object distance do not satisfy Lensmaker's equation then image is blurred.



Circle of Confusion



In-focus

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

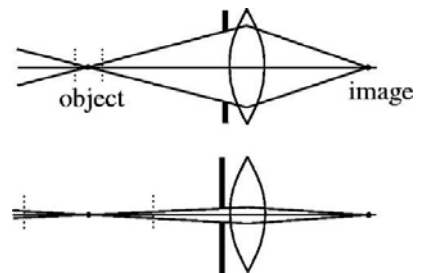
Out-of-focus

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

Circle of confusion is proportional to the size of the aperture.

$$\frac{c}{a} = \frac{d'}{z'} = \frac{s' - z'}{z'}$$

Depth of Field



Aperture affects depth of field:

Smaller aperture:

- better DOF
- increased exposure

Depth of Field



<http://www.cambridgeincolour.com/tutorials/depth-of-field.htm>

Aperture vs. Shutter

Depth of Field

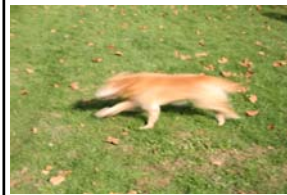


f/22
Small Aperture
(Low speed)



f/4
Large Aperture
(High speed)

Motion Blur



1/30 sec. @ f/22
Small Aperture
(Low speed)



1/6400 sec. @ f/2.5
Large Aperture
(High speed)

Camera optics - issues

Lens Zoom

Field of View (FOV)

Lens Aberrations

Radial Distortion

Vignetting

Chromatic Aberration

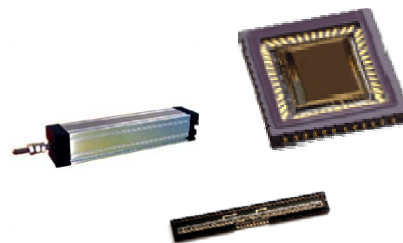
Spherical aberration

Astigmatism

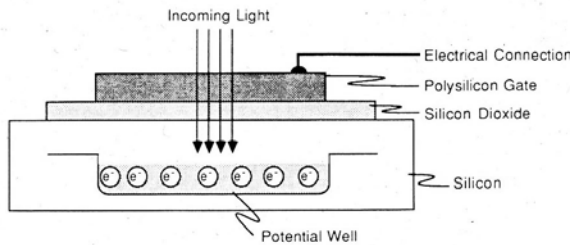
Coma

Lens Glare

Image Acquisition - Sensors



Simple Photodetector (Pixel)



Stores as many as 10^5 electrons, though 10^4 more typical

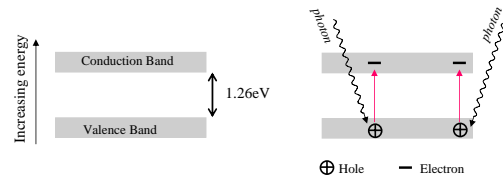
The photoelectric effect

Atoms in a silicon crystal have electrons arranged in discrete energy bands
Valence Band (lower energy) **Conduction Band** (higher energy).

Most electrons occupy the Valence band but can be excited by photons or heat into the conduction band by the absorption of a photon. Requires 1.26 electron volts.

Once in the conduction band the electron is free to move about in the lattice of the silicon crystal, leaving a 'hole' in the valence band which acts like a positively charged carrier. In the absence of an external electric field the hole and electron will quickly re-combine and be lost.

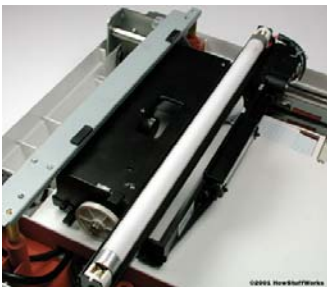
In a CCD an electric field is introduced to sweep these charge carriers apart and prevent recombination.



Thermally generated electrons are indistinguishable from photo-generated electrons → 'Dark Current'.

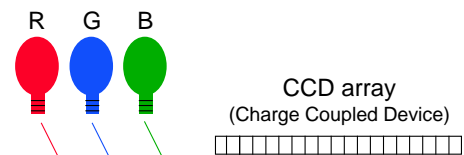
Keep CCDs cold!

Scanners

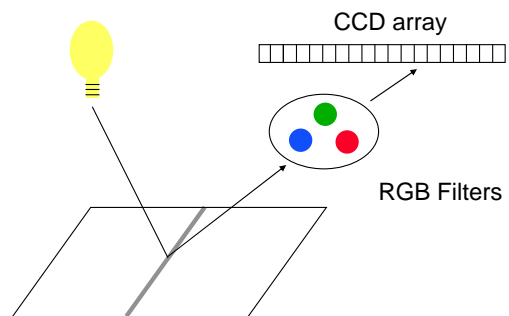


<http://computer.howstuffworks.com/scanner.htm>

3 Pass Color Scanner

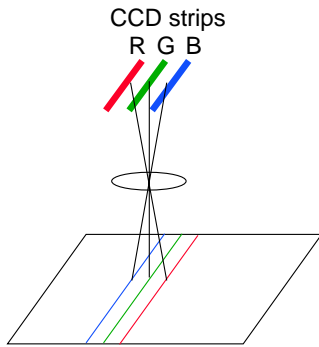


- Slow
- Image registration

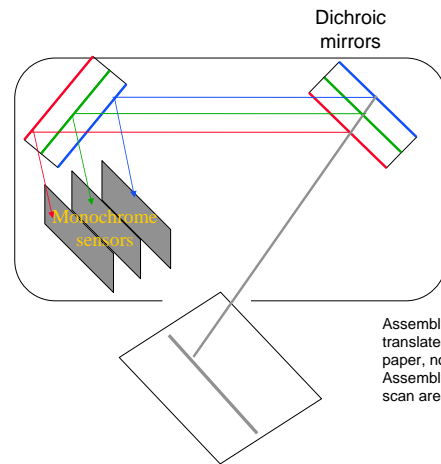


1 Pass Color Scanner

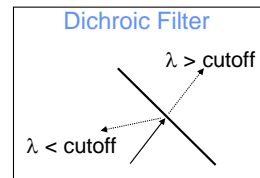
(Hitachi)
Pipeline design



1 Pass scanner - HP-Scanjet

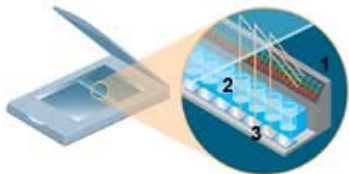


Assembly translates across paper, not to scale. Assembly is small, scan area is large



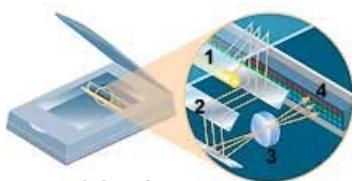
Contact Image Sensors (CIS) Scanner

CIS Scanner



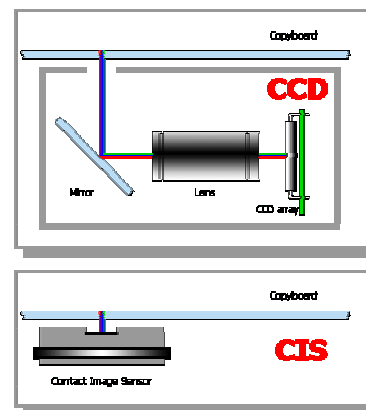
Array of image sensors lies just under the scanned document and catch the reflected light directly.

LEDs illuminate the scan line (using time multiplexing in RGB) and Light Pipes guide lights to sensors.



CCD Scanner

Contact Image Sensors (CIS) Scanner vs Charge Coupled Device (CCD) Scanners



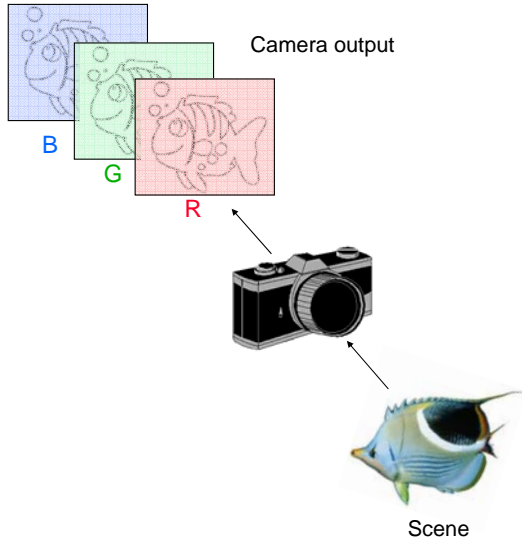
CIS scanners are :

- Cheaper to manufacture
- Smaller and more durable (good for handheld and small devices)
- Require less power (can use battery or USB port).

However:

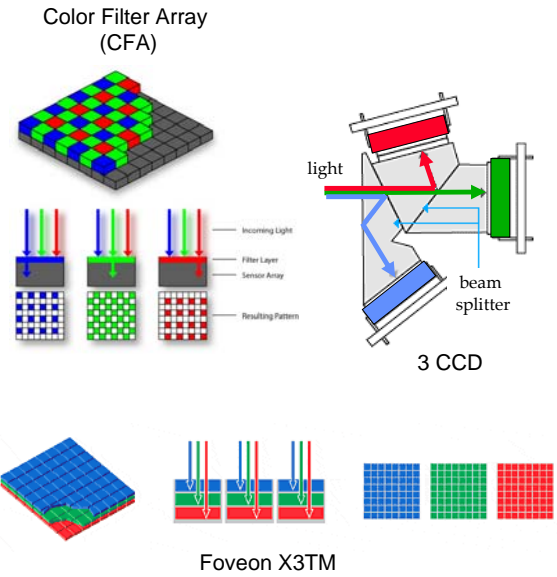
CIS scan at lower resolution than CCD scanners.

Digital Cameras



Digital Cameras

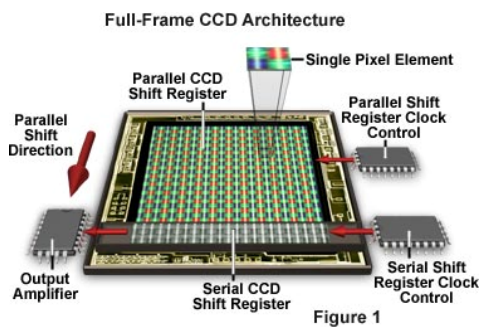
Architectures



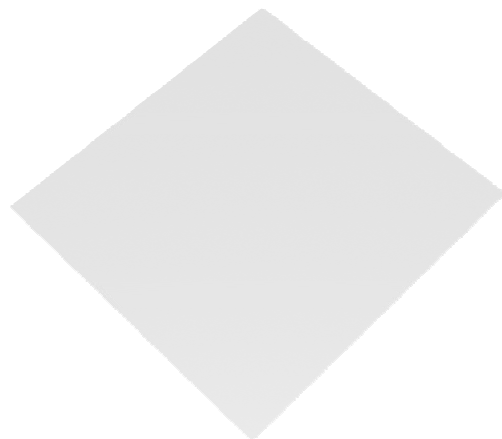
CCD pixel structure

First charge coupled device was developed in 1973 by Sherman Fairchild For astronomy purposes. Increased sensitivity of telescopes by 100.

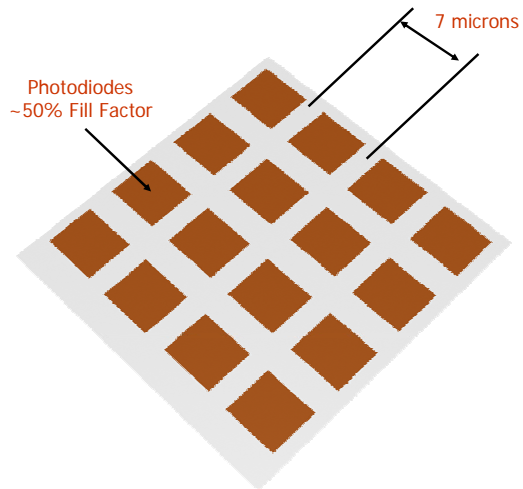
A 2001 amateur astronomer with a CCD camera and a 15 cm telescope collects as much light as an 1960 astronomer with a photographic plate and a 1m telescope. (Simon Tulloch)



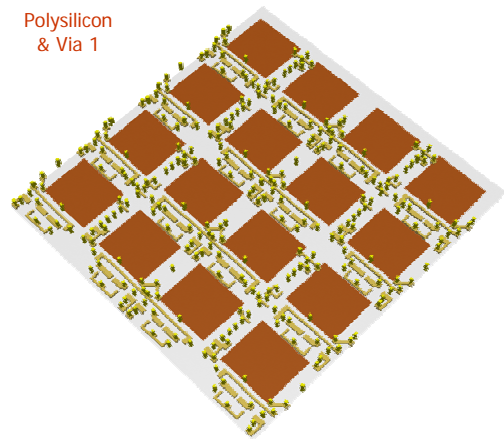
Digital Pixel Sensor (DPS) Structure



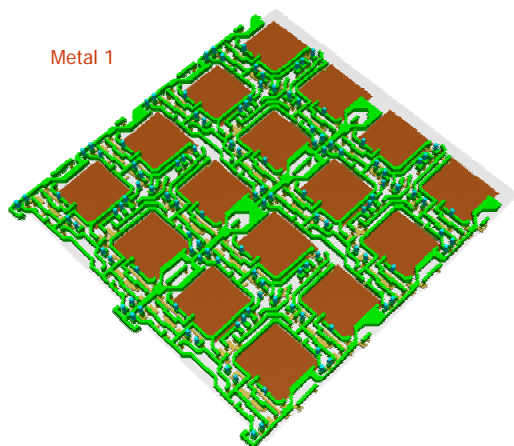
DPS – Pixel Structure



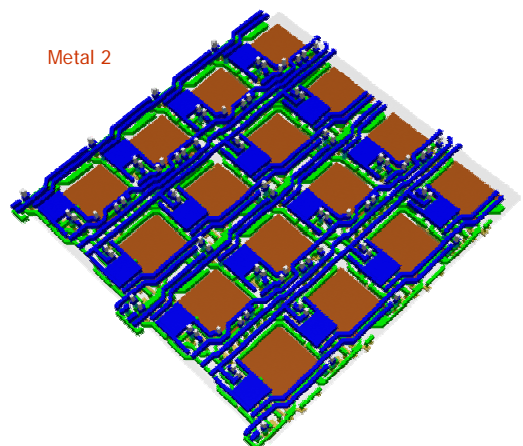
DPS – Pixel Structure



DPS – Pixel Structure

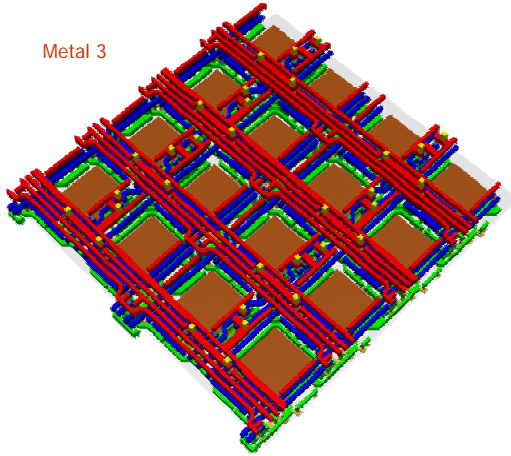


DPS – Pixel Structure



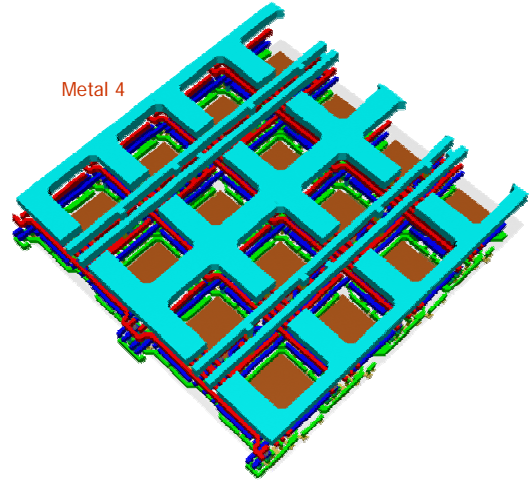
DPS – Pixel Structure

Metal 3

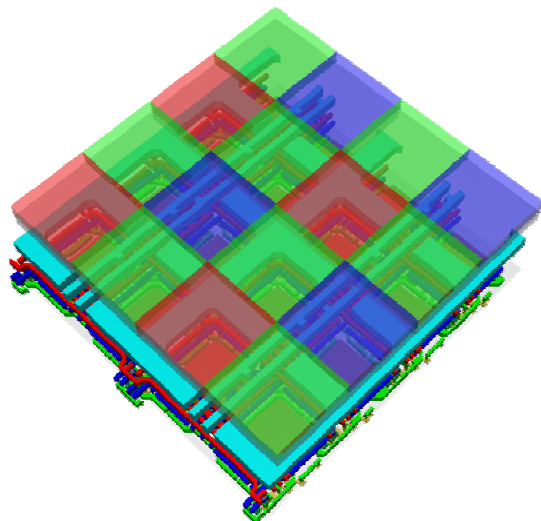


DPS – Pixel Structure

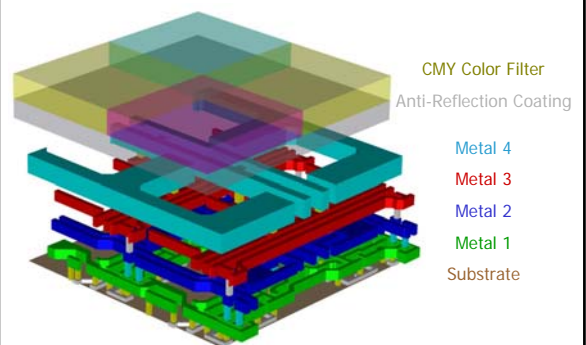
Metal 4



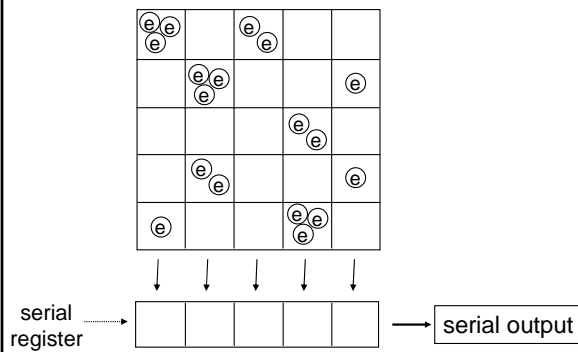
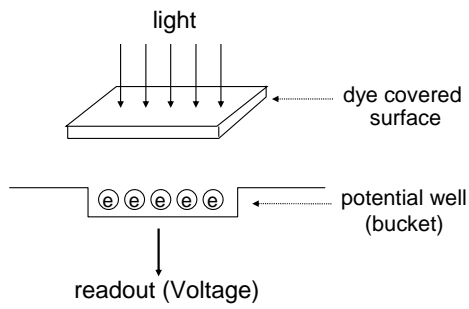
DPS – Pixel Structure



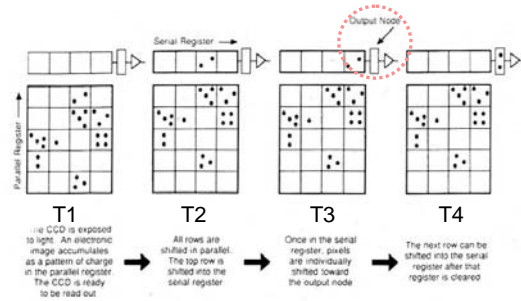
Dynamo Pixel Quad



Charge Coupled Device (CCD)

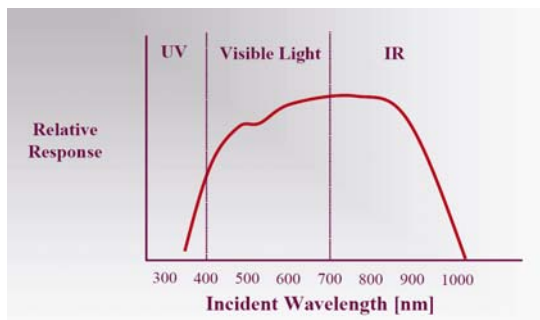


Charge transfer in a full frame CCD



At Output node, analog-to-digital converter turns each pixel's value into a digital value.

Spectral Response of a Typical CCD



Camera Sensors

Two types of sensor technology:

Charge Coupled Device (CCD).



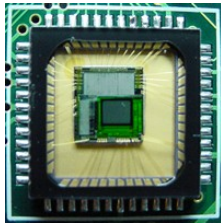
Complementary Metal Oxide Semiconductor (CMOS)



CMOS Imagers

CMOS approach is more flexible because each pixel can be read individually.

- Fabrication cost
- Power
- Integration



Single Capture - Single Image

CCD image capture



OR

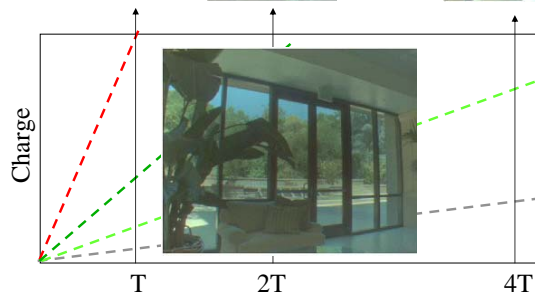


OR



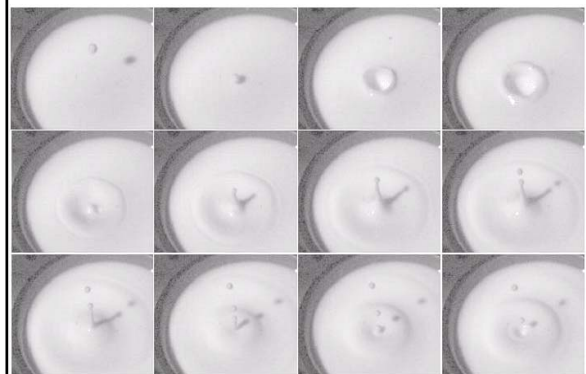
High Dynamic Range (HDR)

Multiple Capture Single Image



High Dynamic Range (HDR)

System Operation at 1400 fps (CDS, play back at 30 fps)



Programmable Digital Camera (PDC) project
Abbas El Gammal & Brian Wandell - Stanford University
10,000 Frames/Sec DPS Chip
<http://www-isl.stanford.edu/~abbas/group/>

Noise Characteristics

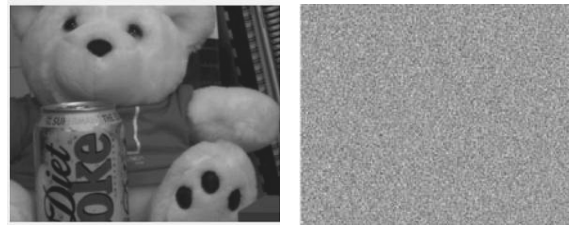
Noise Sources

- Dark Noise (Constant)
- Photon noise (Poisson)
- Shot noise (Poisson)
- Thermal noise (Poisson)
- Resetting (fixed)
- Read-out noise (white)
- Read-out noise (1/f)

(After T. Lomheim, The Aerospace Corporation)

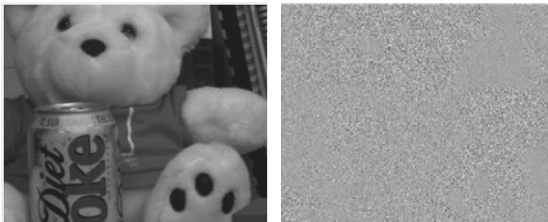
http://www.stw.tu-ilmenau.de/~ff/beruf_cc/cmos/cmos_noise.pdf

Dark Current and Dark Noise



Photon Noise

- More noise in bright parts of the image
- You can identify the white and black regions from the noise image



Fixed Pattern Noise

- Spatial variation in pixel output under uniform illumination due to device and interconnect parameter variations (mismatches across sensors).
- For CCD: appears random
- For CMOS: higher than CCD noise and may appear as 'stripes' (column noise).



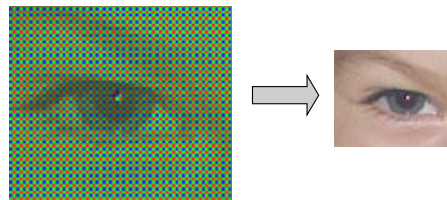
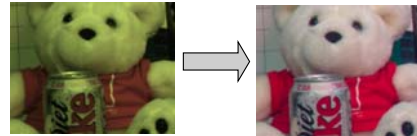
CCD vs CMOS

- CCD sensors create high-quality, low-noise images. CMOS sensors, are more susceptible to noise.
 - Because each pixel on a CMOS sensor has several transistors located next to it, the light sensitivity of a CMOS chip is lower. Many of the photons hitting the chip hit the transistors instead of the photodiode.
 - CMOS sensors consume little power. CCDs, consume lots of power (~ 100 times more power).
 - CMOS chips can be fabricated on standard silicon production line, so they are inexpensive compared to CCDs.
 - CCD sensors have been mass produced for a long time, so they are more mature. They tend to have higher quality pixels, and more of them.
- CCDs tend to be used in cameras that focus on high-quality images with lots of pixels and excellent light sensitivity. CMOS sensors usually have lower quality, lower resolution and lower sensitivity. However, CMOS cameras are less expensive and have great battery life.

<http://electronics.howstuffworks.com/digital-camera4.htm>

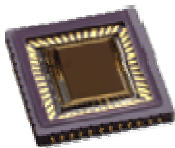
Acquisition Devices – Problems

- Calibration (raw to sRGB, Gamma)
- Color Correction (White Balancing)
- Demosaicing

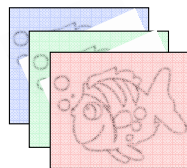


Camera Calibration

Given sensor output determine mapping to RGB values. LUT or Matrix.



Voltage Range:
0 ..10⁴

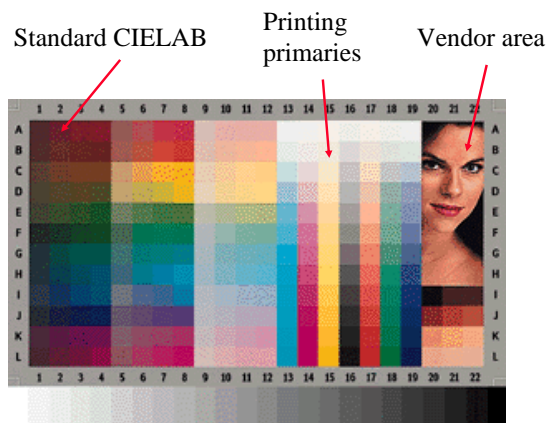


RGB Camera output:
0 ... 255

Linear Mapping is typically NOT sufficient

Camera Calibration

ANSI IT8.7 (Kodak-Q60)



- Columns 1-3, 5-7 and 9-11 have 108 standardized CIELAB values
- Accuracy to 10 ΔE_{ab}
- Produced by Kodak, Agfa, others

<ftp://ftp.kodak.com/gastds/Q60DATA/TECHINFO.PDF>

Camera Calibration

Altona TestSuite1.2a



<ftp://ftp.kodak.com/gastds/Q60DATA/TECHINFO.PDF>

Camera Calibration

Build sensor response matrixes:

$$\begin{bmatrix} | & | & \cdots & | \\ r_1 & r_2 & \cdots & r_n \\ | & | & \cdots & | \end{bmatrix} = M \begin{bmatrix} | & | & \cdots & | \\ r'_1 & r'_2 & \cdots & r'_n \\ | & | & \cdots & | \end{bmatrix}$$

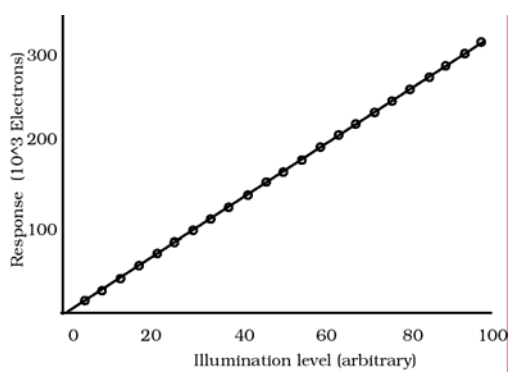
↑
Target RGB (xyY)
values

↑
Sensor output
values

Solve

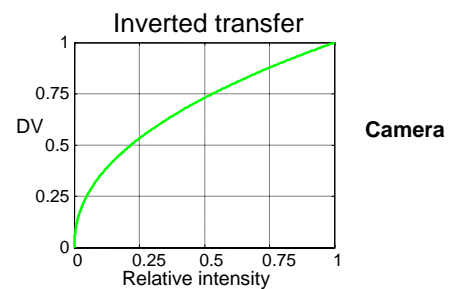
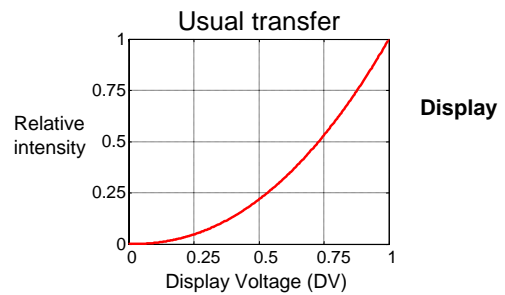
$$M = \begin{bmatrix} | & | & \cdots & | \\ r_1 & r_2 & \cdots & r_n \\ | & | & \cdots & | \end{bmatrix} \begin{bmatrix} | & | & \cdots & | \\ r'_1 & r'_2 & \cdots & r'_n \\ | & | & \cdots & | \end{bmatrix}^*$$

CCD and CMOS Sensor Transduction Functions Are Usually Linear



(Epperson, P.M. et al. *Electro-optical characterization of the Tektronix TK5 ... Opt Eng.*, 25, 1987)

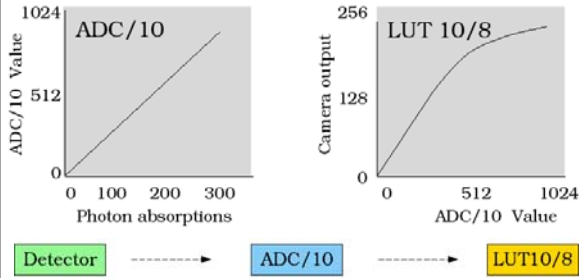
Display transduction function is usually nonlinear



$dv = [0:255]/255;$
 $I = dv.^{(2.2)};$

Digital camera transduction is often implemented by look-up tables (LUTs)

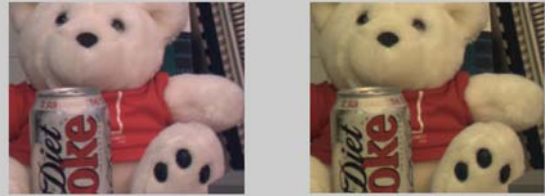
Gamma Correction



**Color Correction
White Balance**

Illuminant 1

Illuminant 2

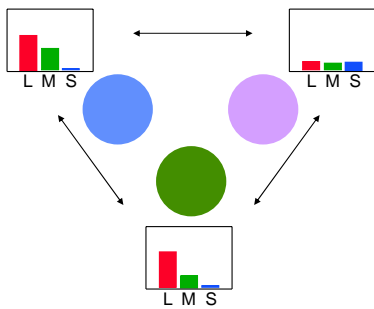


Affects of Illumination

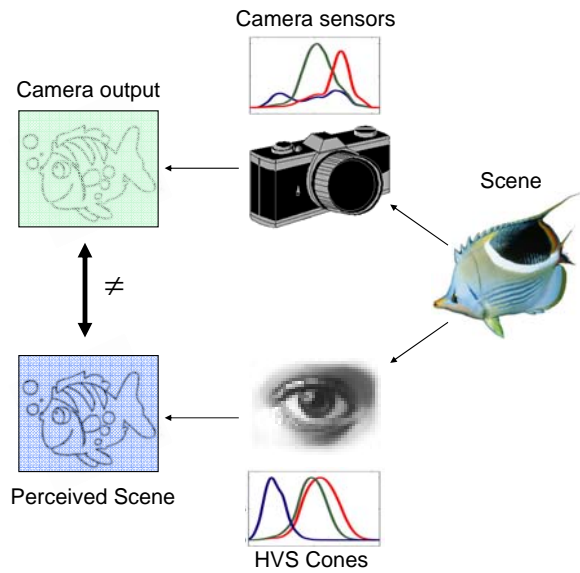
Color Constancy

Absolute level of cone responses does **not** define an object's color appearance.

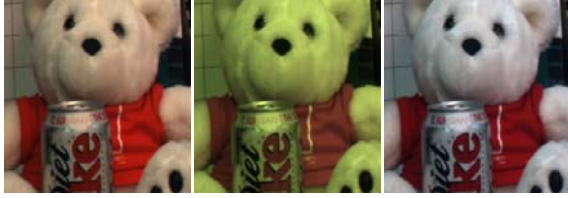
The level of sensor responses relative to responses to other objects in the scene defines the color appearance of an object..



Camera vs Perceived



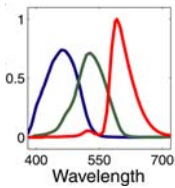
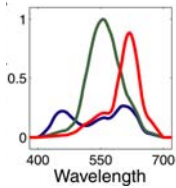
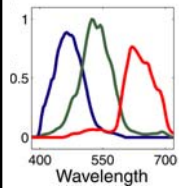
Additional Variations due to Camera Sensors



QImaging

Kodak

Nikon



White balance



User sets white balance manually - defines color mapping.

White balance

Tungsten

Sun



Yellow Balanced

Red Balanced



Blue Balanced

Auto

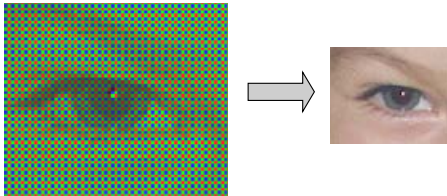


Illumination Correction

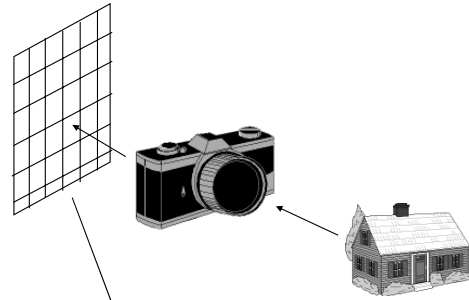
Change image acquired under one illumination, to appear as if taken under a different illumination.

- Linear Models
- Retinex
- Gray World Assumption
- Brightest Point Assumption
- Specularity

Demosaicing



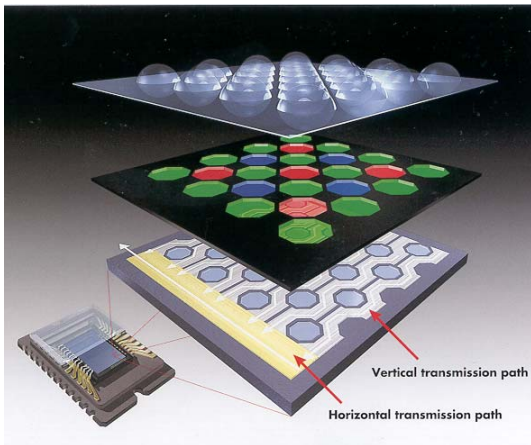
Digital Cameras - Color Filter Arrays (CFA)



R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B
R	G	R	G	R	G	R	G
G	B	G	B	G	B	G	B

CCD Array

Sensor Architecture



Fuji Corporation

Color Filter Array (CFA)

Bayer CFA

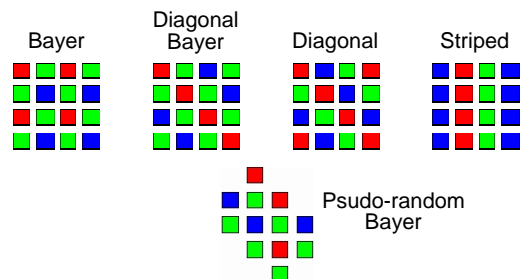
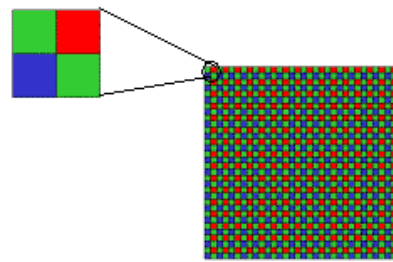
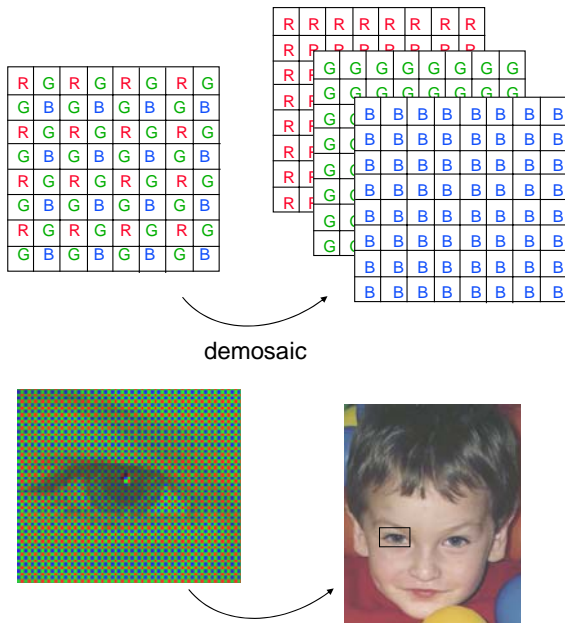


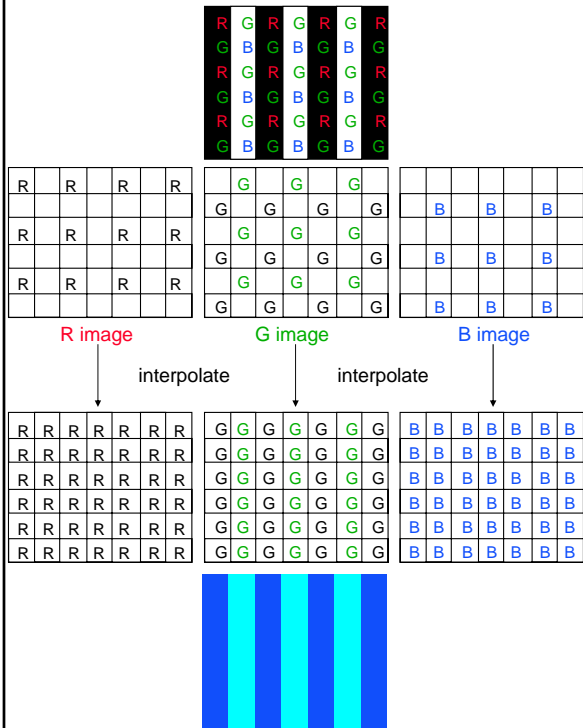
Image Demosaicing



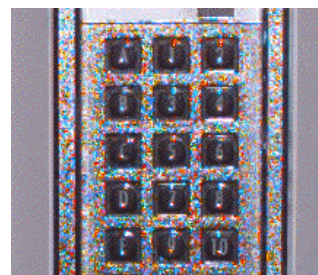
Demosaicing – Solutions

- Using spatial coherence:
 - Non adaptive:
 - Nearest Neighbor interpolation
 - Bilinear interpolation
 - Bicubic interpolation, etc.
 - Adaptive:
 - Edge sensing interpolation
- Using color coherence:
 - Non Adaptive
 - Adaptive

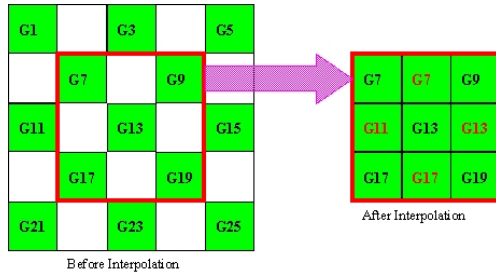
Demosaic Aliasing



Demosaicing - Example



Demosaicing: Nearest Neighbor



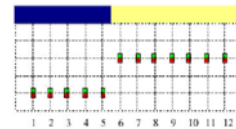
Nearest neighbor interpolation: Take the value of a missing pixel from its nearest neighbor's value.

Problematic in gradient areas and near edges

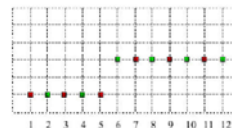
Demosaicing: Linear interpolation

- Assuming piecewise linear function
- Artifacts near edges

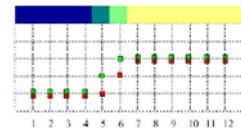
$$G(k) = (G(k+1) + G(k-1)) / 2$$



original



input



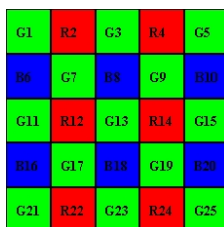
linear interpolation

Demosaicing: Bilinear Interpolation

Existing values are left untouched. The average of adjacent green pixel values is interpolated.

For example

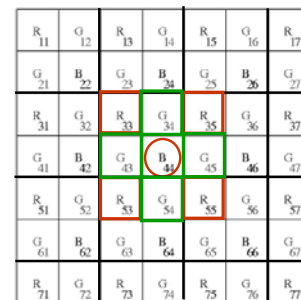
$$G8 = (G3 + G7 + G9 + G13) / 4$$



Demosaicing: Bilinear Interpolation

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

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





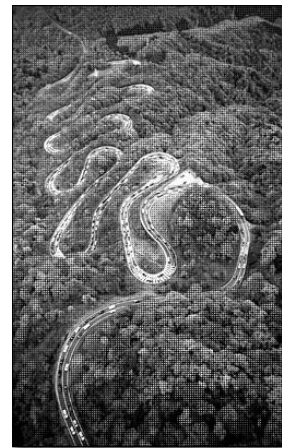
Mosaic Image



Bilinear Interpolation



Bilinear Interpolation



Mosaic image

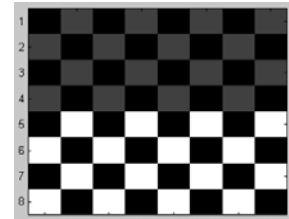


Bilinear Interpolation

Adaptive Demosaicing

R G R

 G B G
 R G R



- Goal: Don't average across edges.
- Method: Before averaging, check:
 - direction of gradient
 - and/or
 - check for outliers
- Average only similar neighboring G values

Adaptive 2D Interpolation

$$\Delta h = \text{abs}[G_{45} - G_{43}]$$

$$\Delta v = \text{abs}[G_{34} - G_{54}]$$

$$G_{44} = \begin{cases} \frac{G_{34} + G_{54}}{2} & \text{if } \Delta h \gg \Delta v \\ \frac{G_{43} + G_{45}}{2} & \text{if } \Delta v \gg \Delta h \\ \frac{G_{34} + G_{54} + G_{43} + G_{45}}{4} & \text{if } \Delta v \approx \Delta h \end{cases}$$

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

Adaptive 2D Interpolation

$$w_{45} = f(B_{46} - B_{44})$$

$$w_{34} = f(B_{24} - B_{44})$$

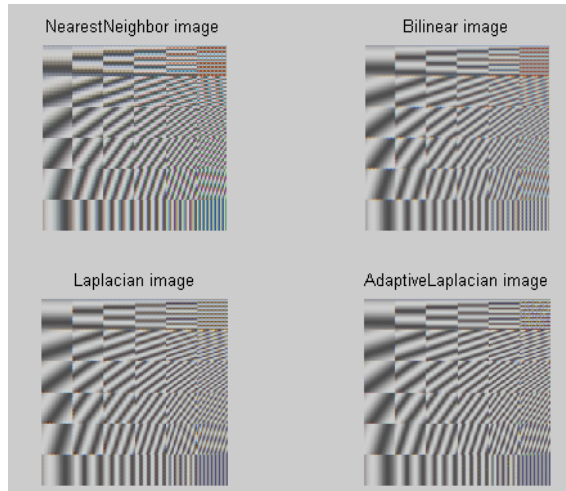
$$w_{43} = f(B_{42} - B_{44})$$

$$w_{54} = f(B_{64} - B_{44})$$

$$G_{44} = \frac{w_{45}G_{45} + w_{34}G_{34} + w_{43}G_{43} + w_{54}G_{54}}{w_{45} + w_{34} + w_{43} + w_{54}}$$

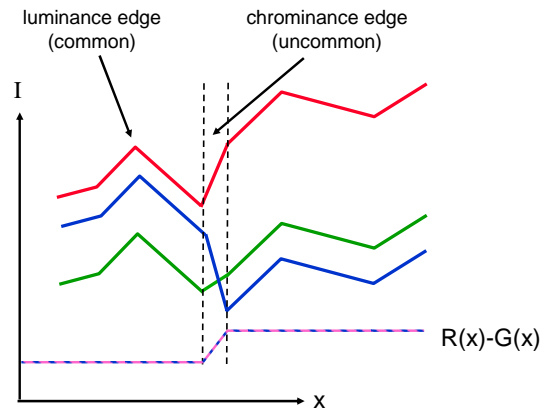
R ₁₁	G ₁₂	R ₁₃	G ₁₄	R ₁₅	G ₁₆	R ₁₇
G ₂₁	B ₂₂	G ₂₃	B ₂₄	G ₂₅	B ₂₆	G ₂₇
R ₃₁	G ₃₂	R ₃₃	G ₃₄	R ₃₅	G ₃₆	R ₃₇
G ₄₁	B ₄₂	G ₄₃	B ₄₄	G ₄₅	B ₄₆	G ₄₇
R ₅₁	G ₅₂	R ₅₃	G ₅₄	R ₅₅	G ₅₆	R ₅₇
G ₆₁	B ₆₂	G ₆₃	B ₆₄	G ₆₅	B ₆₆	G ₆₇
R ₇₁	G ₇₂	R ₇₃	G ₇₄	R ₇₅	G ₇₆	R ₇₇

Demosaicing Evaluation Tools



Demosaicing – Solutions

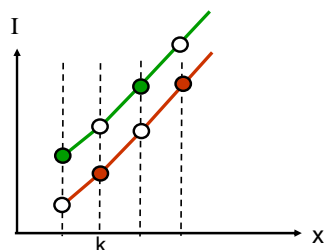
Color Coherence: Color bands are highly correlated in high frequencies



Spatial + Color Coherence

$$R(x)-G(x) \approx C_{rg}$$

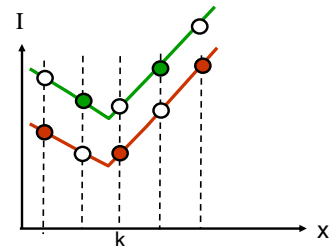
$$R'(x)=G'(x)=B'(x)$$



- **Spatial coherence:** $G(k)=(G(k-1)+G(k+1))/2$
 - **Color coherence:** $C_{rg}=\text{average}\{R(x)-G(x)\}$
- $$R(k)=G(k)+C_{rg}$$

Problem: Fails near luminance and chrominance edges
Solution: Adaptive interpolation

Spatial + Color Coherence - Adaptive



Exploit color coherence for G interpolation:

Since $R'(x)=G'(x)$ we have

$$\tilde{G}_{k|k+1} = G_{k+1} + \frac{(R_k - R_{k+2})}{2}$$

$$\tilde{G}_{k|k-1} = G_{k-1} + \frac{(R_k - R_{k-2})}{2}$$

The estimates for G_k can be combined using an adaptive scheme

Spatial + Color Coherence - Adaptive

Edge Sensing Interpolation using
Color Coherence:

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

$$\tilde{G}_{44|45} = G_{45} + \frac{(B_{44} - B_{46})}{2}$$

$$\tilde{G}_{44|43} = G_{43} + \frac{(B_{44} - B_{42})}{2}$$

$$\tilde{G}_{44|34} = G_{34} + \frac{(B_{44} - B_{24})}{2}$$

$$\tilde{G}_{44|54} = G_{54} + \frac{(B_{44} - B_{64})}{2}$$

$$G_{44} = \frac{w_{45} \tilde{G}_{44|45} + w_{34} \tilde{G}_{44|34} + w_{43} \tilde{G}_{44|43} + w_{54} \tilde{G}_{44|54}}{w_{45} + w_{34} + w_{43} + w_{54}}$$

$$R_{44} = \frac{w_{33} \tilde{R}_{44|33} + w_{35} \tilde{R}_{44|35} + w_{55} \tilde{R}_{44|55} + w_{53} \tilde{R}_{44|53}}{w_{33} + w_{35} + w_{55} + w_{53}}$$

$$\tilde{R}_{44|ij} = G_{44} + (R_{ij} - G_{ij})$$



Bilinear



Adaptive + color coherence



Bilinear



Adaptive + color coherence



Bilinear



Adaptive



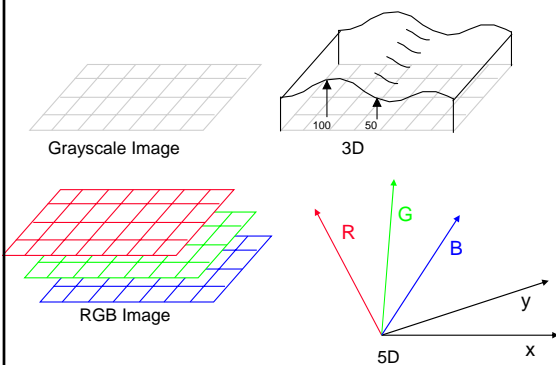
Demosaicing - Other Approaches

Regularization

Minimize over a functional with a data fit term and an inter-channel color correlation term.
(Gamer & Keren)

Minimal Surface

Minimize over a functional with a data fit term and a 5D surface area term. (Beltrami Flow)
(Kimmel)



Demosaicing Results

Original



Linear



Kimmel



Kimmel + smooth

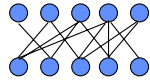


Demosaicing - Various Approaches

Learning Schemes

Learn linear and non linear optimal filters for classes of images (ANN).

(Kapur & Hel-Or)



Demosaicing - Learning Schemes

Channel independent

Perceptron (Linear)



Quadratic - Learned on Image

Quadratic - Learned on Class

Foveon and Sigma



Figure 2. The Sigma SD9 is the first digital camera to use a full-color multi-layer sensor technology: The Foveon X3 sensor.



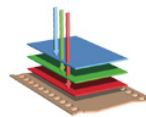
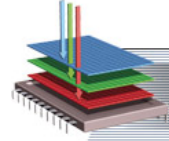
Polaroid X530



Hanvision HVDUO
5M/10M

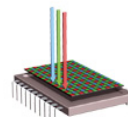
Foveon and Sigma

white light



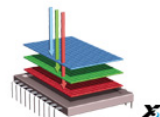
First came film.

COLOR FILM contains three layers of emulsion which directly record red, green, and blue light.



Then came digital.

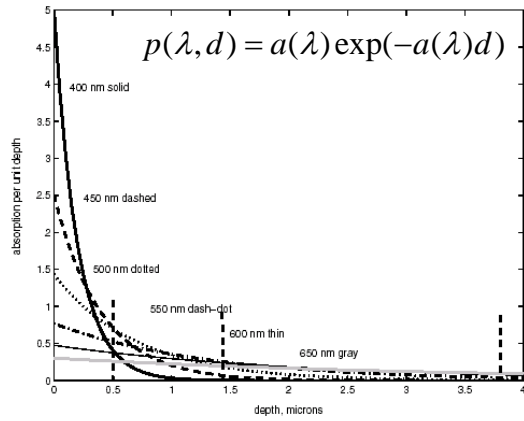
TYPICAL DIGITAL SENSORS have just one layer of pixels and capture only part of the color.



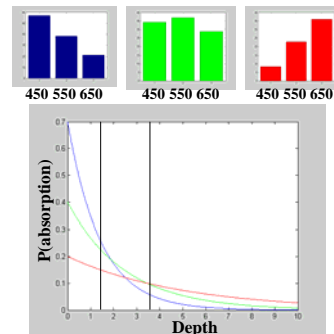
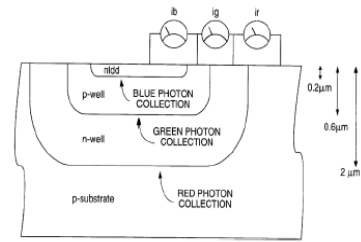
Now there's Foveon X3.

FOVEON X3 direct image sensors have three layers of pixels which directly capture all of the color.

Light absorption in silicon as a function of depth and wavelength

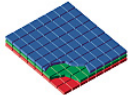


Foveon X3 Pixel (Triple-Well)



X3 Technology

Foveon X3[®] Capture



A Foveon X3 direct image sensor features three separate layers of pixels embedded in silicon.

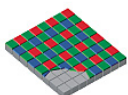


Since silicon absorbs different colors of light at different depths, each layer captures a different color.

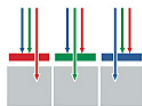


As a result, only Foveon X3 direct image sensors capture red, green, and blue light at every pixel location.

Mosaic Capture



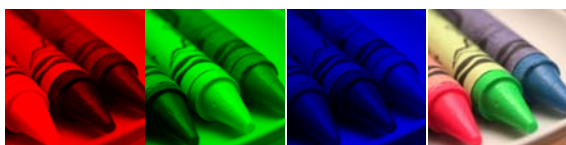
In conventional systems, color filters are applied to a single layer of pixels in a tiled mosaic pattern.



The filters let only one wavelength of light—red, green, or blue—pass through to any given pixel, allowing it to record only one color.



As a result, mosaic sensors capture only 25% of the red and blue light, and just 50% of the green.



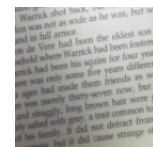
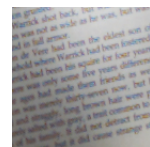
red green blue output

Foveon Technology - Examples

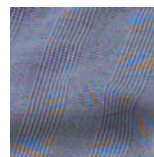
Mosaic Capture



Foveon X3 Capture



Sharpness Color artifacts



Color pipeline Texas Instruments TMS320DSC21

A High Performance, Programmable, Single Chip Digital Signal Processing Solution to Digital Still Cameras

