

Photons and sensors

(with an interlude on the history of color photography)

Lectures on Digital Photography
Spring 2016

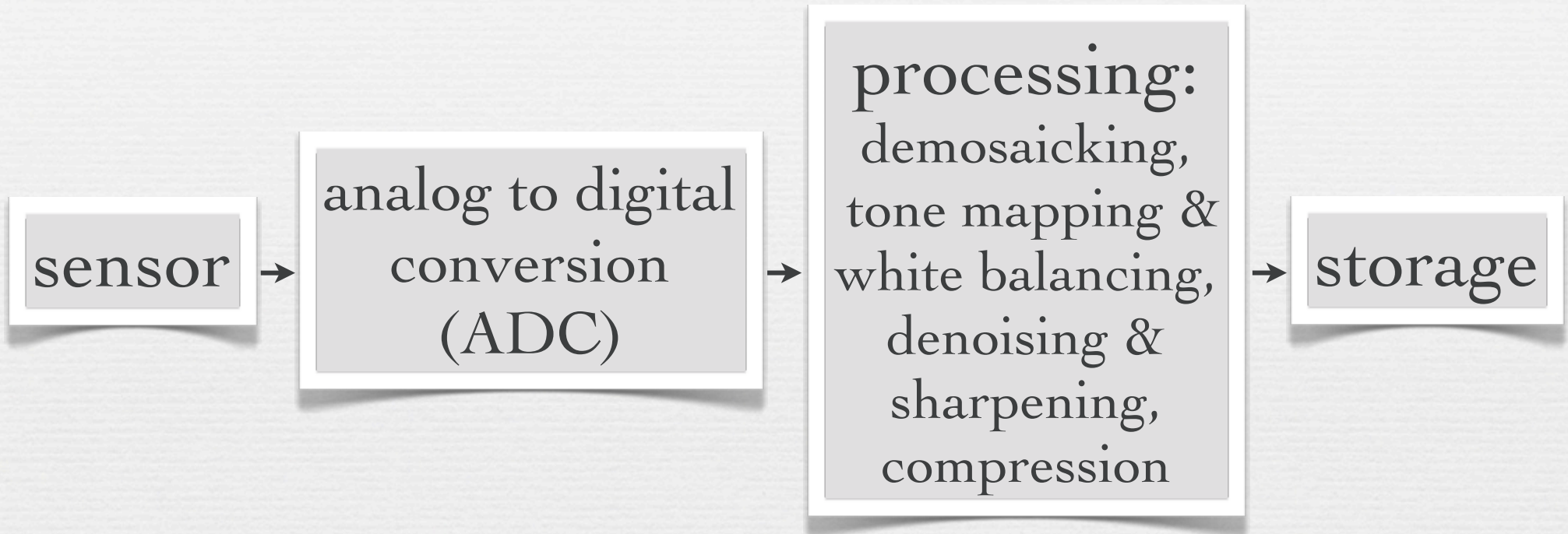


Marc Levoy
Principal Engineer
Google Research



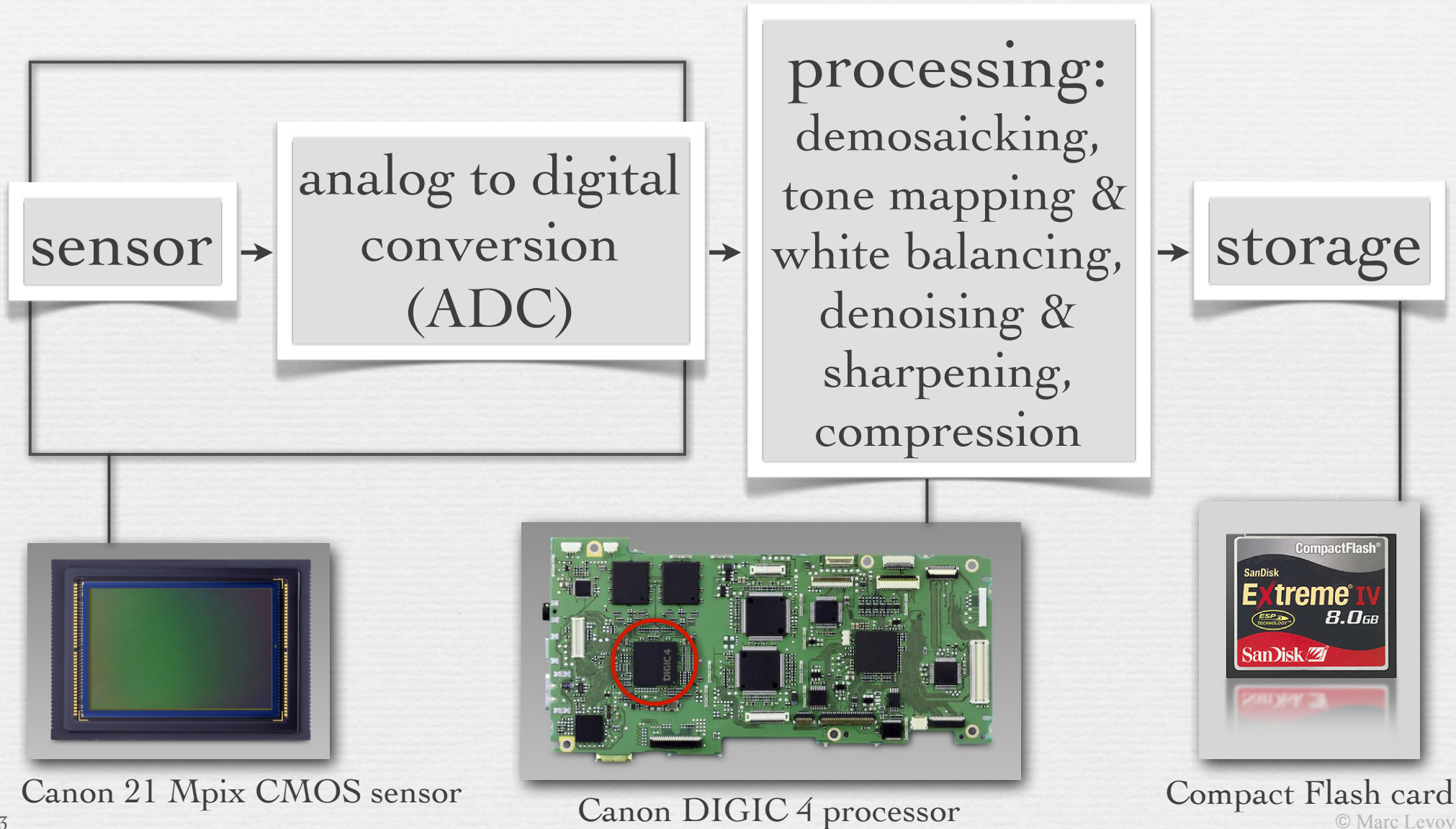
Professor, Emeritus
Computer Science Department
Stanford University

Camera pixel pipeline



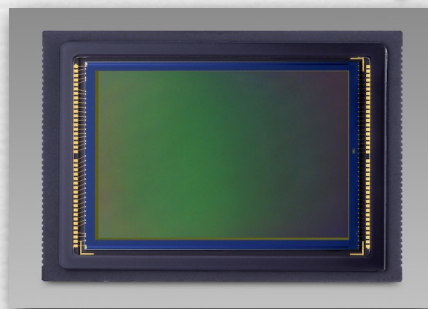
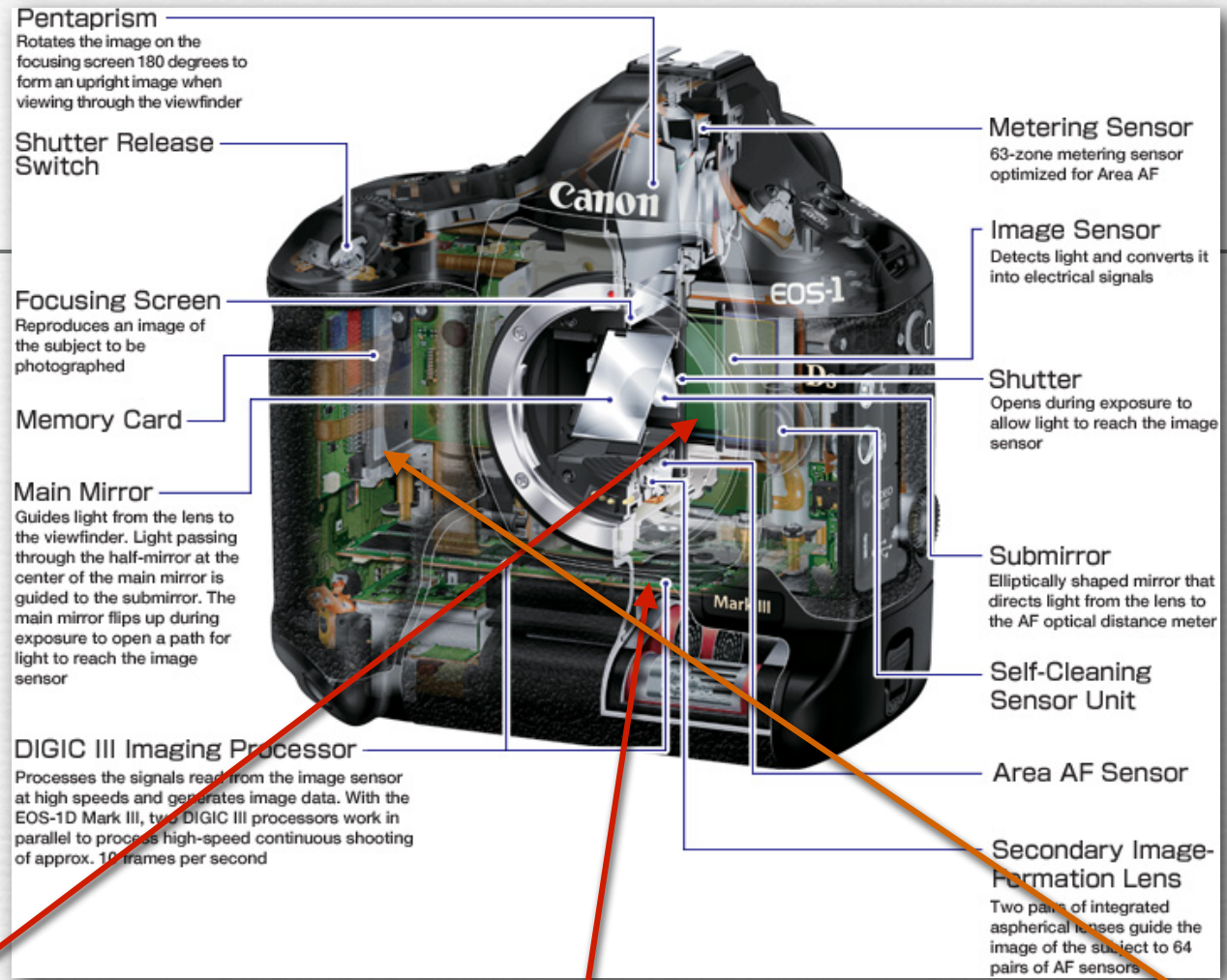
- ◆ every camera uses different algorithms
- ◆ the processing order may vary
- ◆ most of it is proprietary

Example pipeline

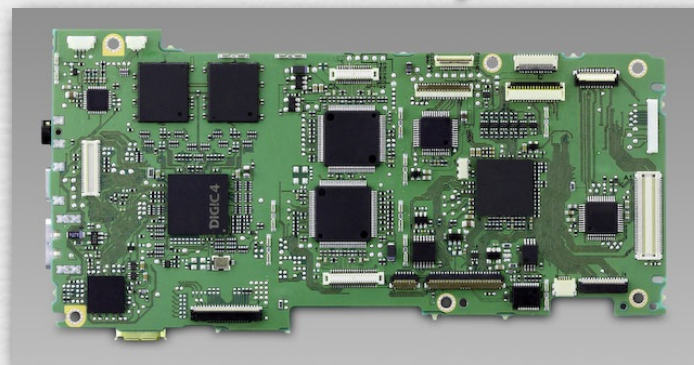


Example

(parts are from a Canon 5DII, but cutaway view is of 1DIII)



Canon 21 Mpix CMOS sensor



Canon DIGIC 4 processor

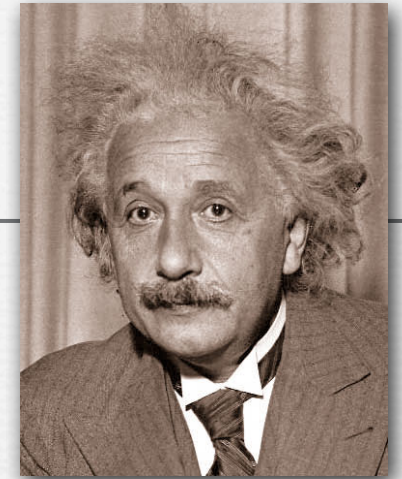


Compact Flash card

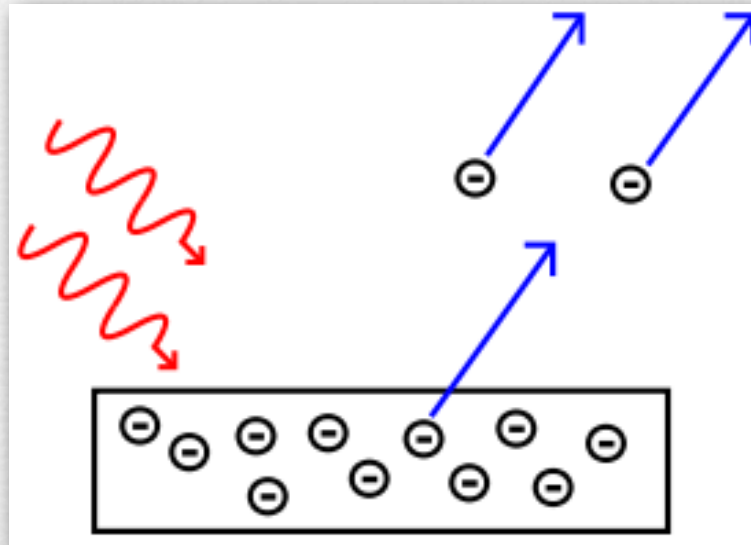
Outline

- ◆ converting photons to charge
- ◆ getting the charge off the sensor
 - CCD versus CMOS
 - analog to digital conversion (ADC)
- ◆ supporting technology
 - microlenses
 - antialiasing filters
- ◆ sensing color

The photoelectric effect



Albert Einstein



(wikipedia)

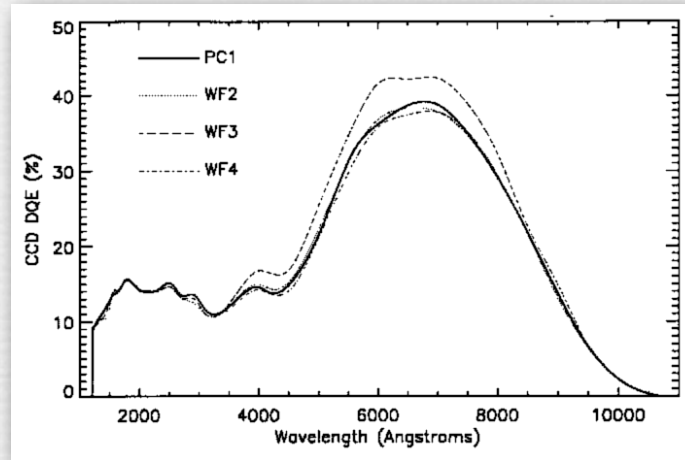
- ◆ when a photon strikes a material, an electron may be emitted
 - depends on the photon's energy, which depends on its wavelength

$$E_{\text{photon}} = \frac{h \times c}{\lambda}$$

- there is no notion of the “color of a photon”, only its energy
- there is no notion of “brighter photons”, only more or fewer of them

Quantum efficiency

Hubble Space
Telescope
Camera 2



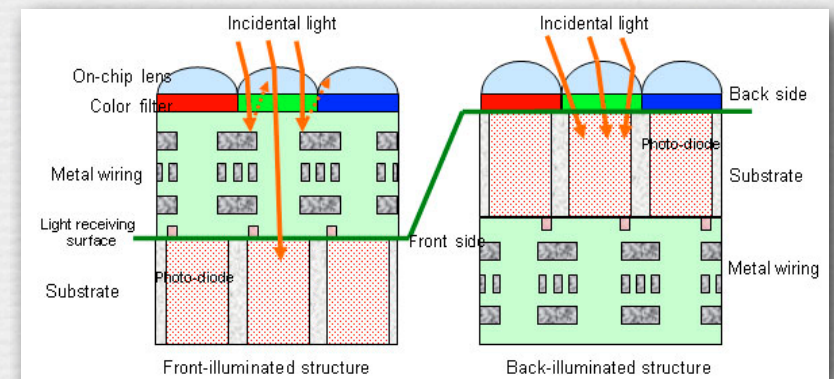
recent iPhones use
a back-illuminated
CMOS sensor

- ◆ not all photons will produce an electron
 - depends on quantum efficiency of the device

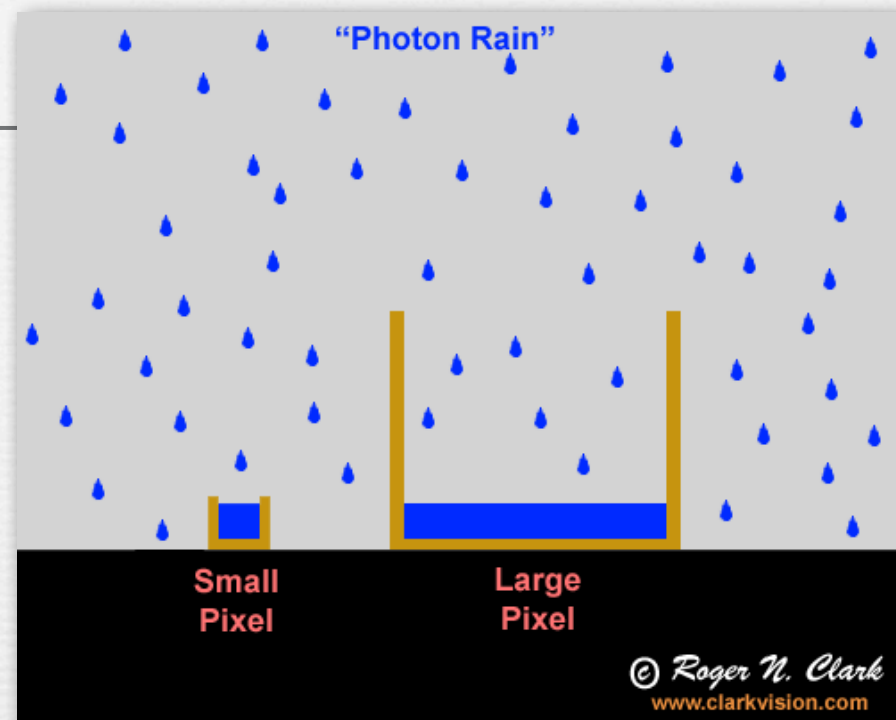
$$QE = \frac{\# \text{ electrons}}{\# \text{ photons}}$$

- human vision: ~15%
- typical digital camera: < 50%
- best back-thinned CCD: > 90%

back-illuminated
CMOS (Sony)

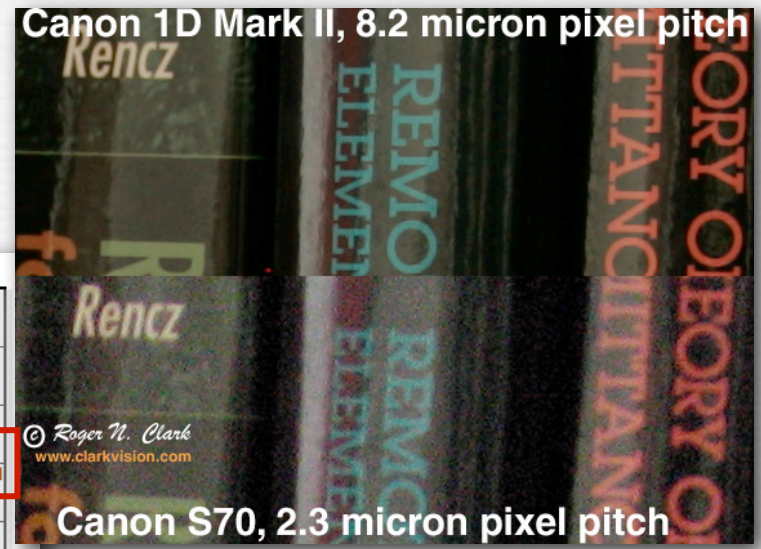
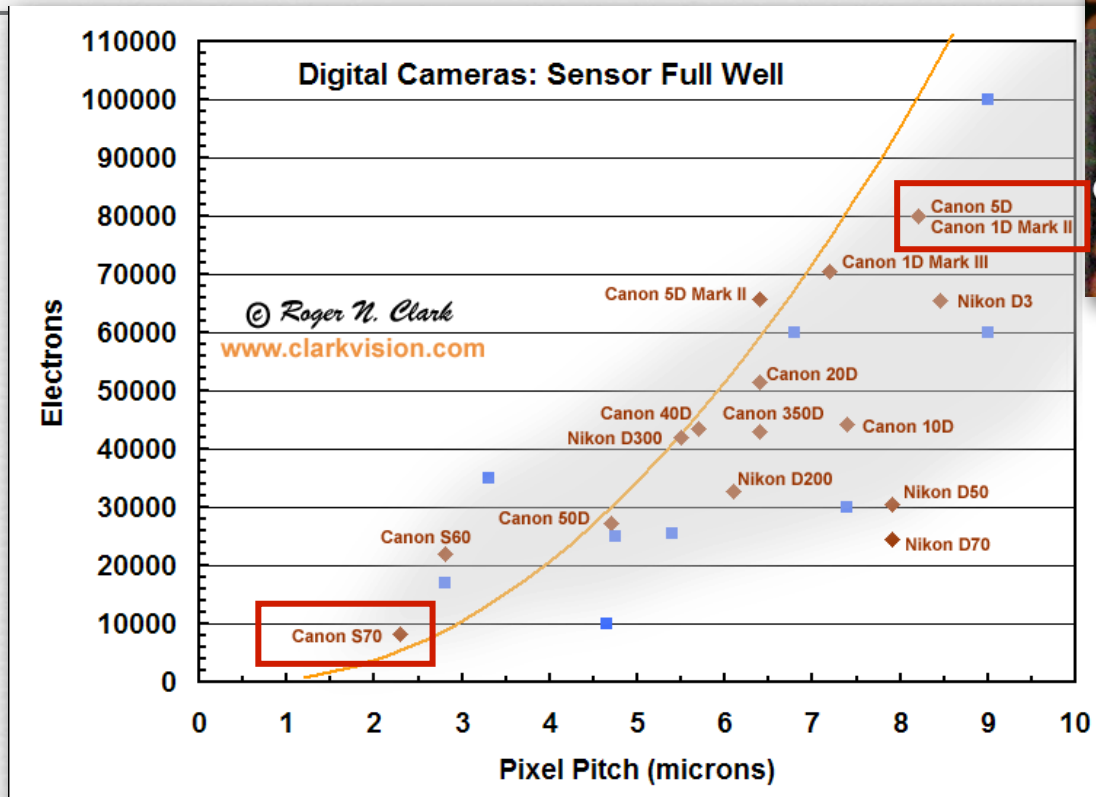


Pixel size



- ◆ the current from one electron is small (10-100 fA)
 - so integrate over space and time (pixel area \times exposure time)
 - larger pixel \times longer exposure means more accurate measure
- ◆ typical pixel sizes
 - Sony RX100: $2.4\mu \times 2.4\mu = 6\mu^2$
 - Canon 5D III: $6.3\mu \times 6.3\mu = 40\mu^2$

Full well capacity



(clarkvision.com)

- ◆ how many electrons can a pixel hold?
 - depends mainly on the size of the pixel (but fill factor is important)
- ◆ too many photons causes *saturation*
 - larger capacity leads to higher *dynamic range* between the brightest scene feature that won't saturate and the darkest that isn't too noisy

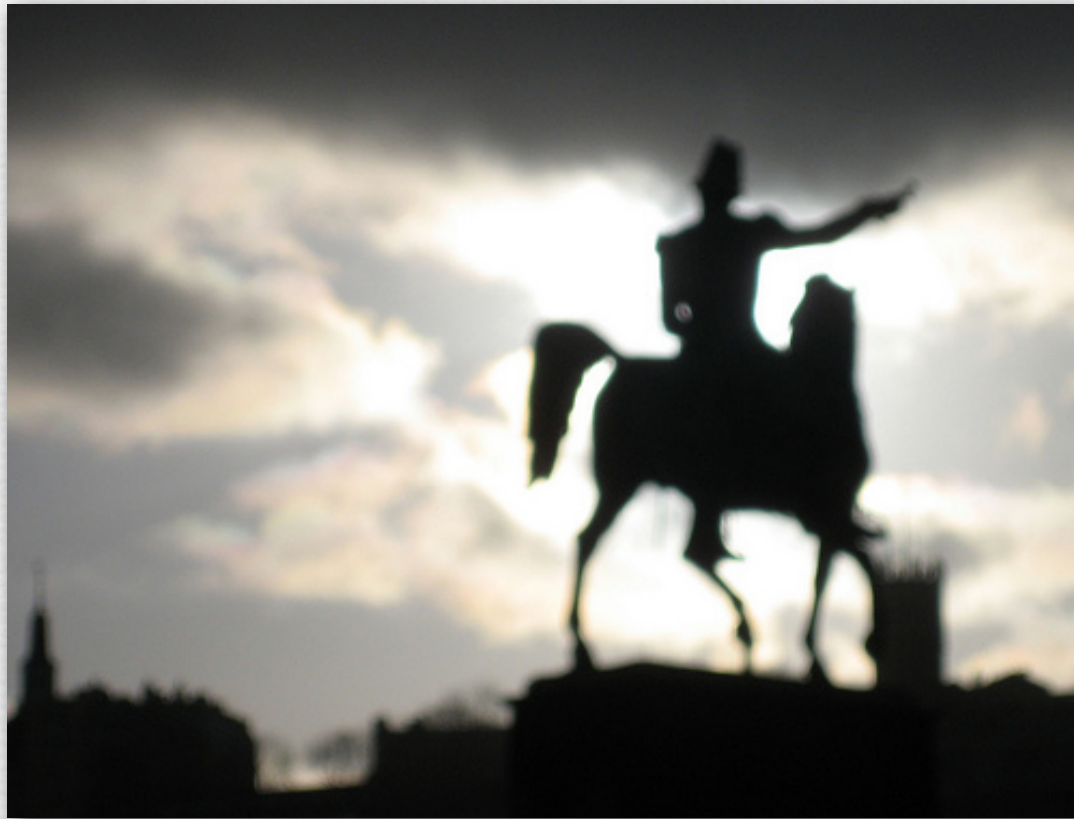
Blooming



(ccd-sensor.de)

- ◆ charge spilling over to nearby pixels
 - can happen on CCD and CMOS sensors
 - don't confuse with glare or other image artifacts

Image artifacts can be hard to diagnose

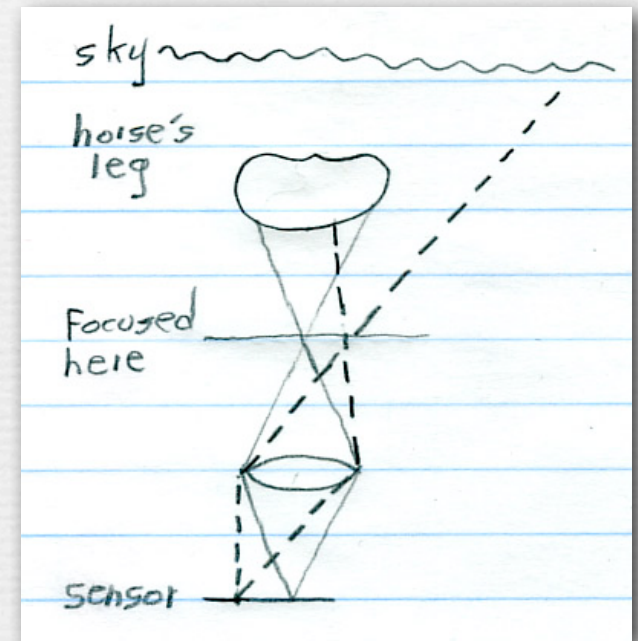


(http://farm3.static.flickr.com/2102/2248725961_540be5f9af.jpg?v=0)

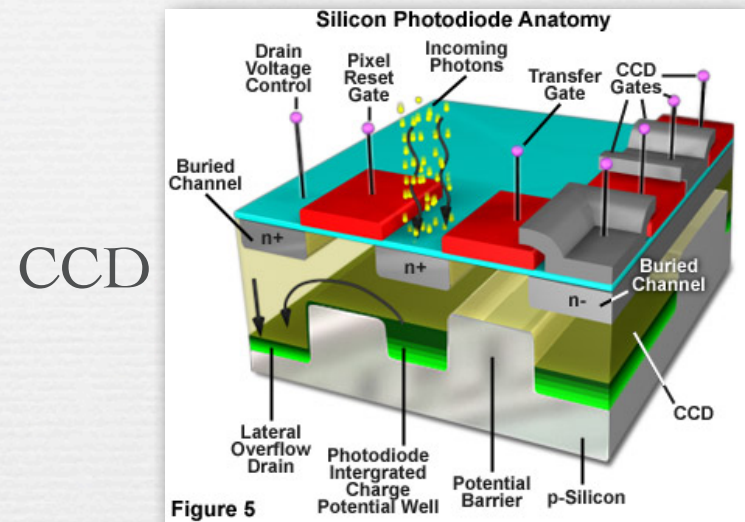
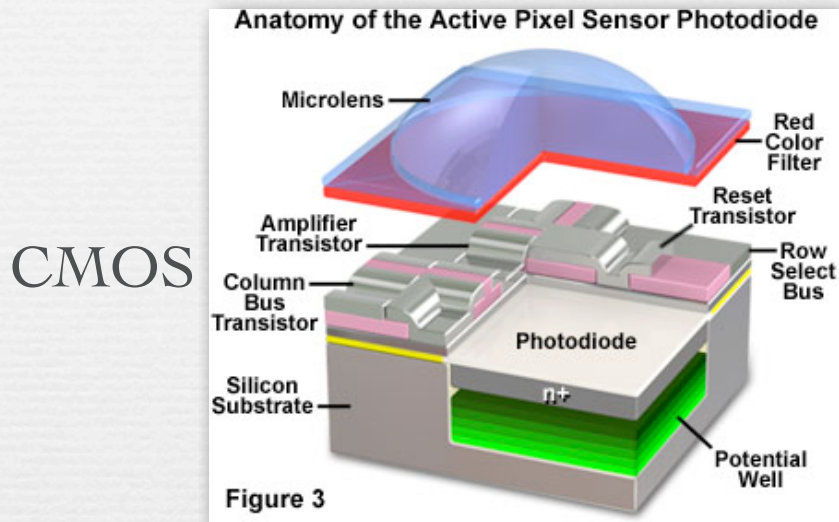
Q. Is this blooming?

Explanation of preceding image (contents of whiteboard)

- ◆ there may be blooming in the sky, but the shrinkage of the horse's leg can be explained purely as a byproduct of misfocus
 - in the accompanying plan view diagram, the horse's leg is shown at top (in cross section)
 - the solid bundle of rays, corresponding to one sensor pixel, crossed before the leg (was misfocused), then spread out again, but saw only more leg, so its color would be dark
 - the dashed bundle of rays, corresponding to a nearby pixel, crossed at the same depth but to the side of the solid bundle, then spread out again, seeing partly leg and partly sky; its color would be lighter than the leg
 - this lightening would look like the sky was "blooming" across the leg, but it's just a natural effect produced by misfocus



CMOS versus CCD sensors

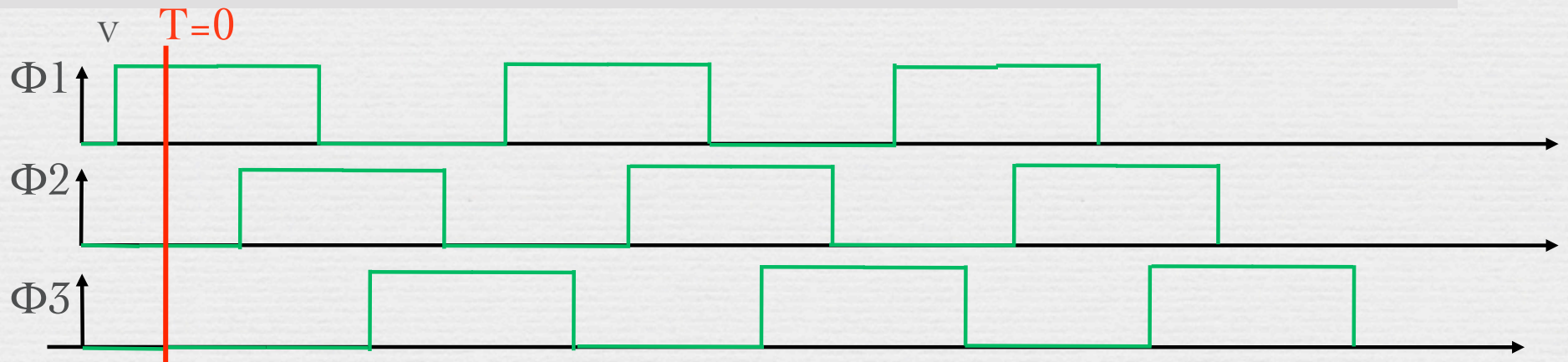
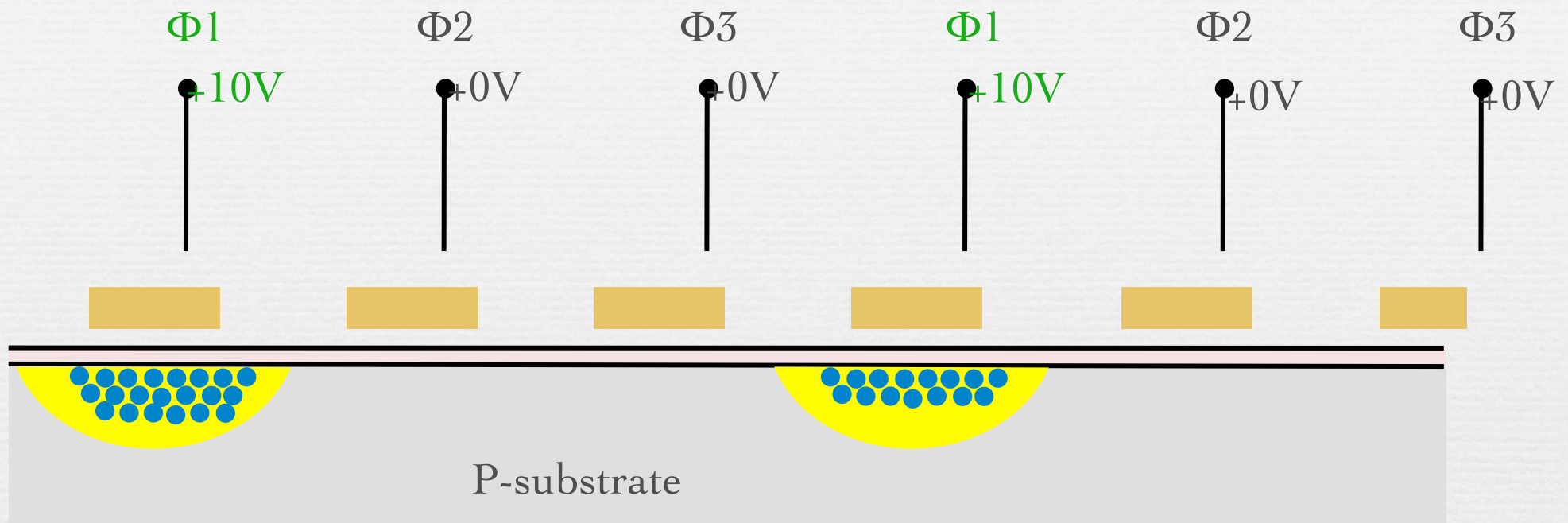


- ◆ CMOS = complementary metal-oxide semiconductor
 - an amplifier per pixel converts charge to voltage
 - low power, but noisy (but getting better)
- ◆ CCD = charge-coupled device
 - charge shifted along columns to an output amplifier
 - analog to digital converter (ADC) is off-chip
 - highest image quality, but not as fast or cheap as CMOS

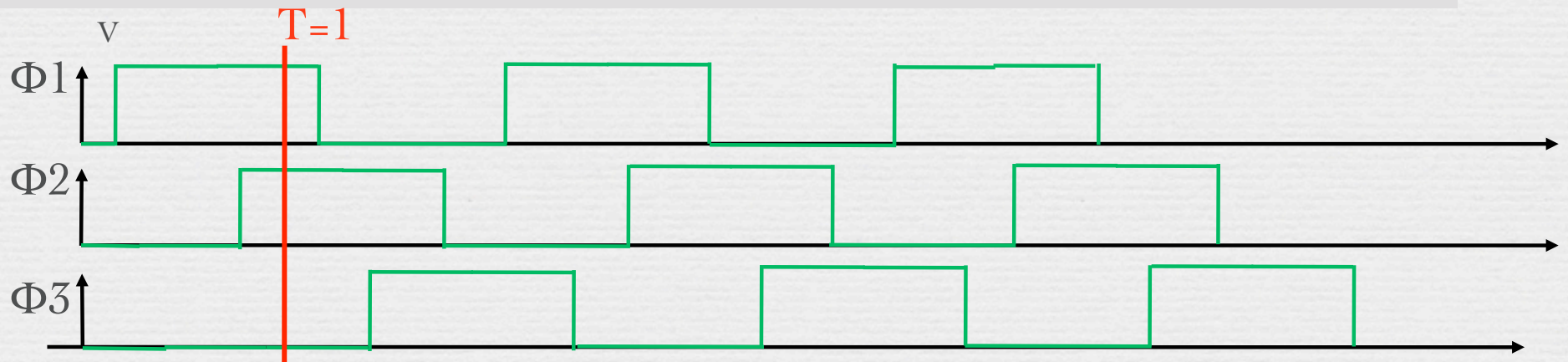
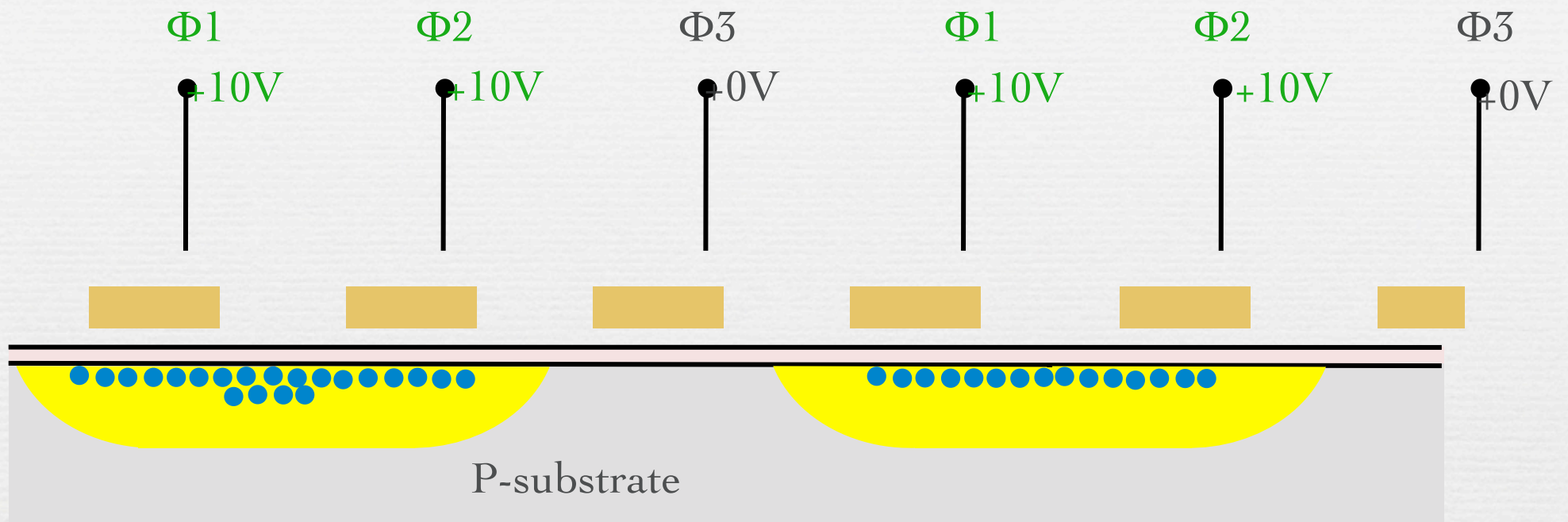
Nikon D40

Canon SLRs

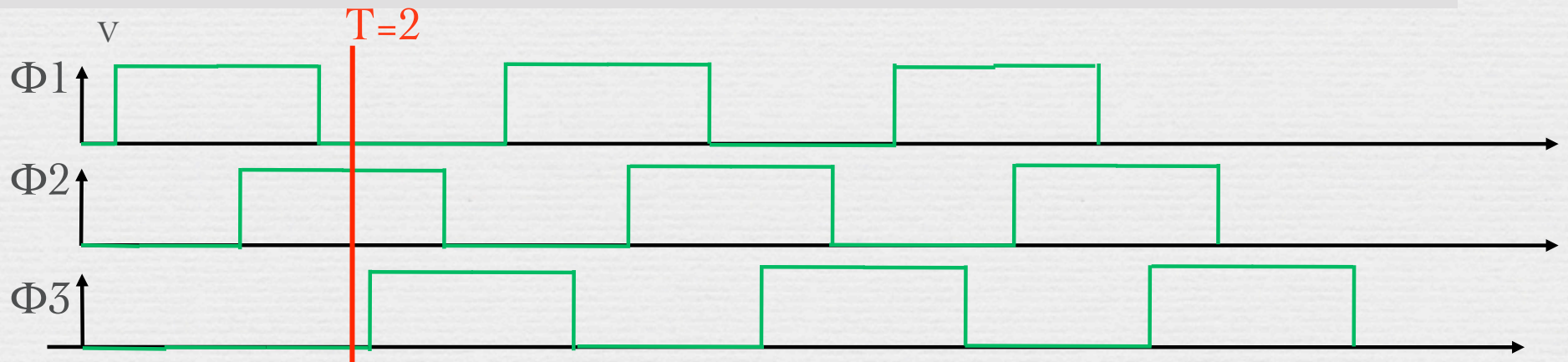
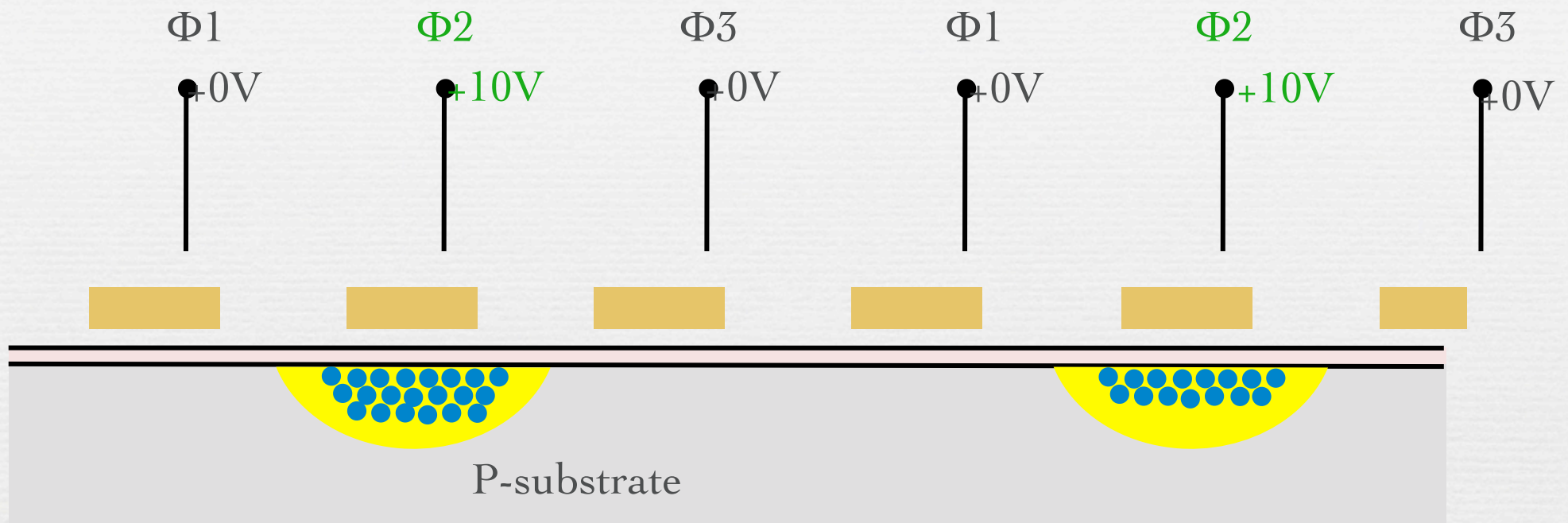
Gratuitous animation showing a CCD “bucket brigade” readout



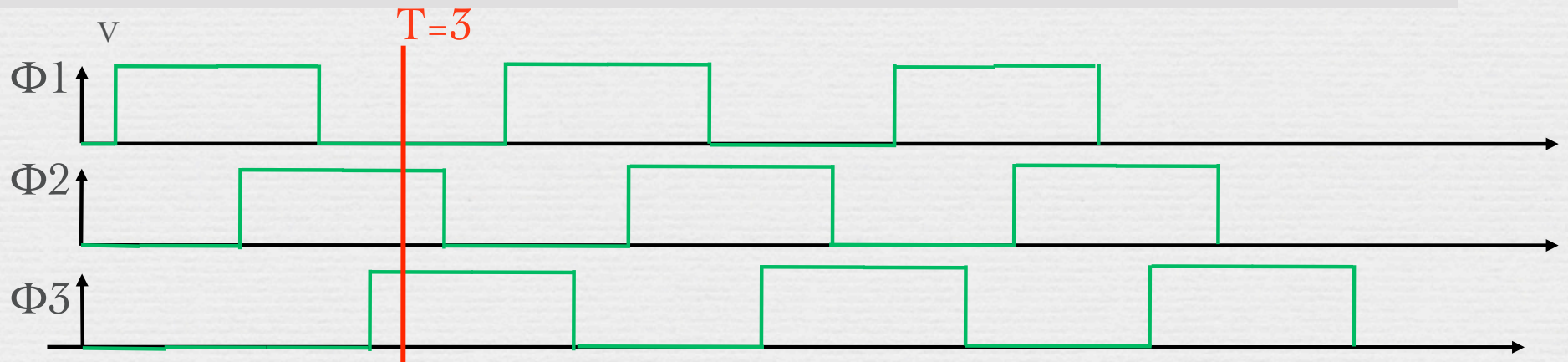
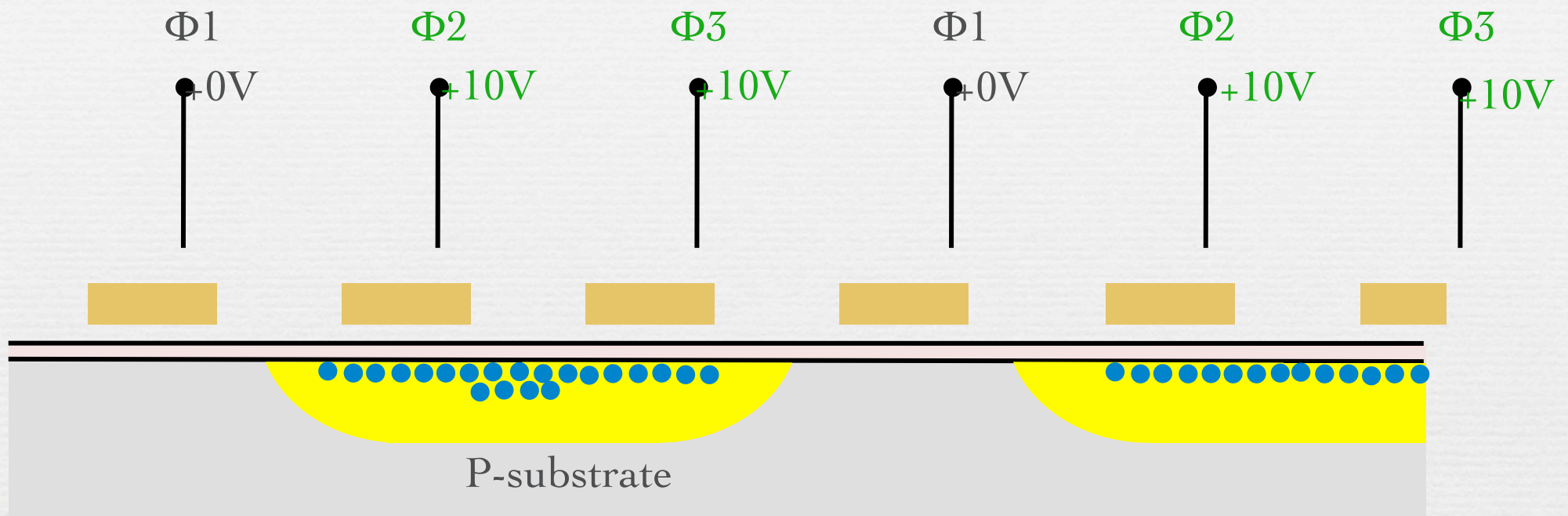
Gratuitous animation showing a CCD “bucket brigade” readout



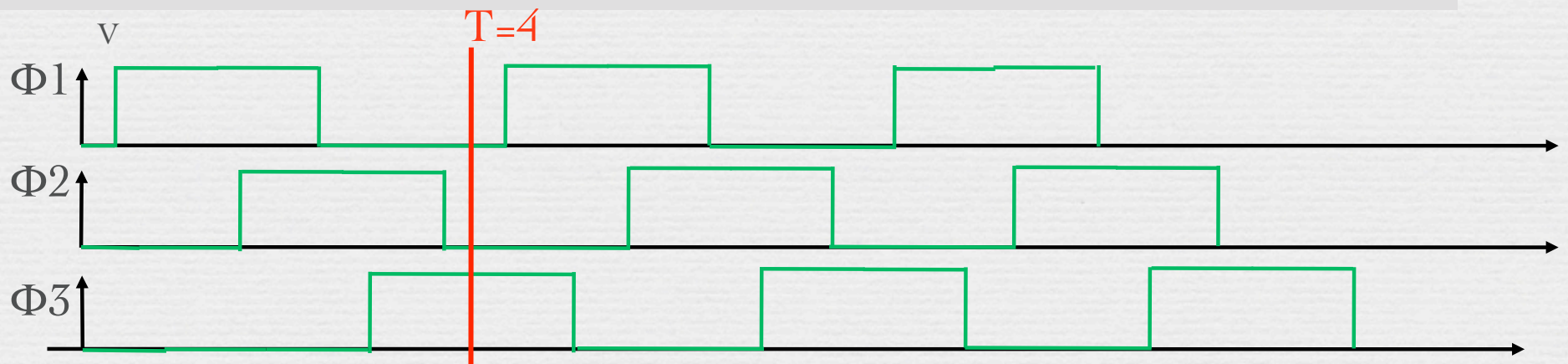
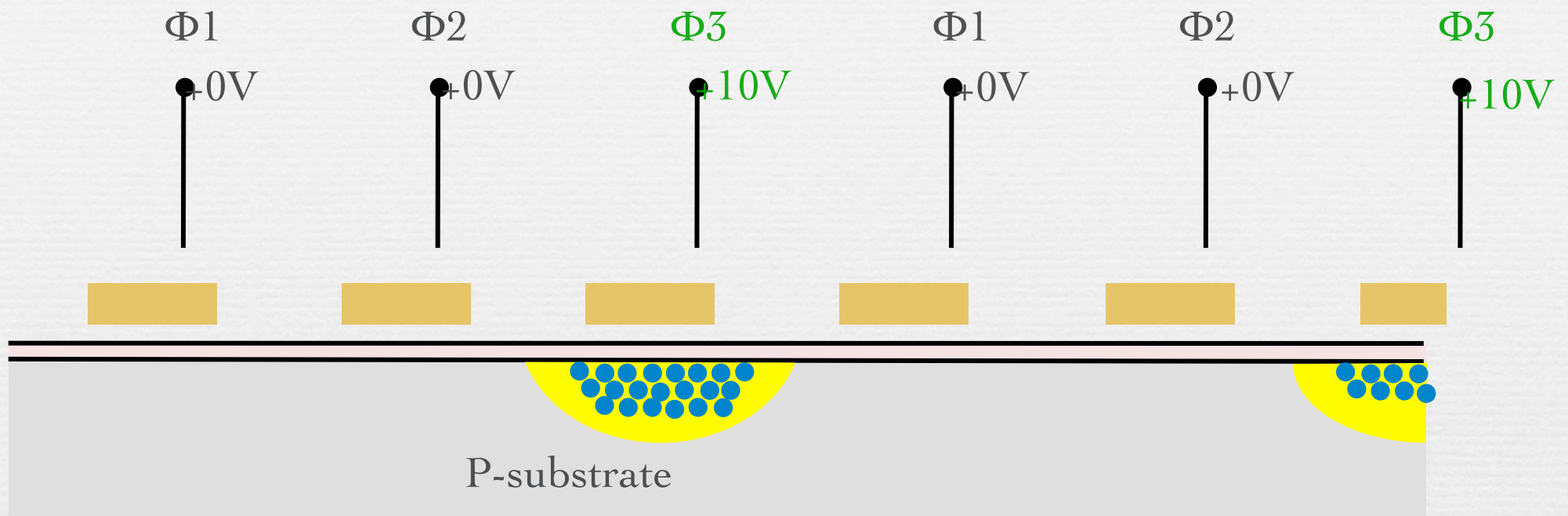
Gratuitous animation showing a CCD “bucket brigade” readout



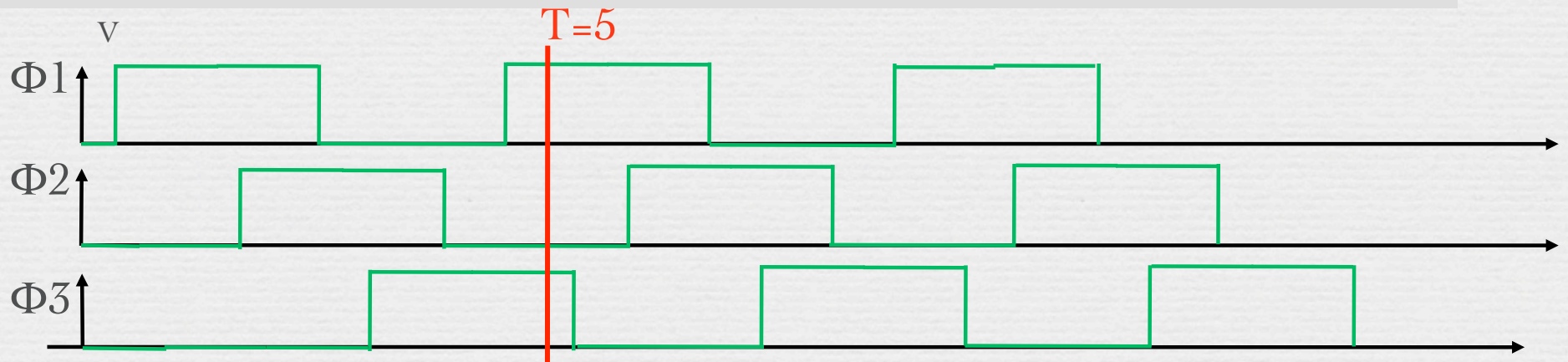
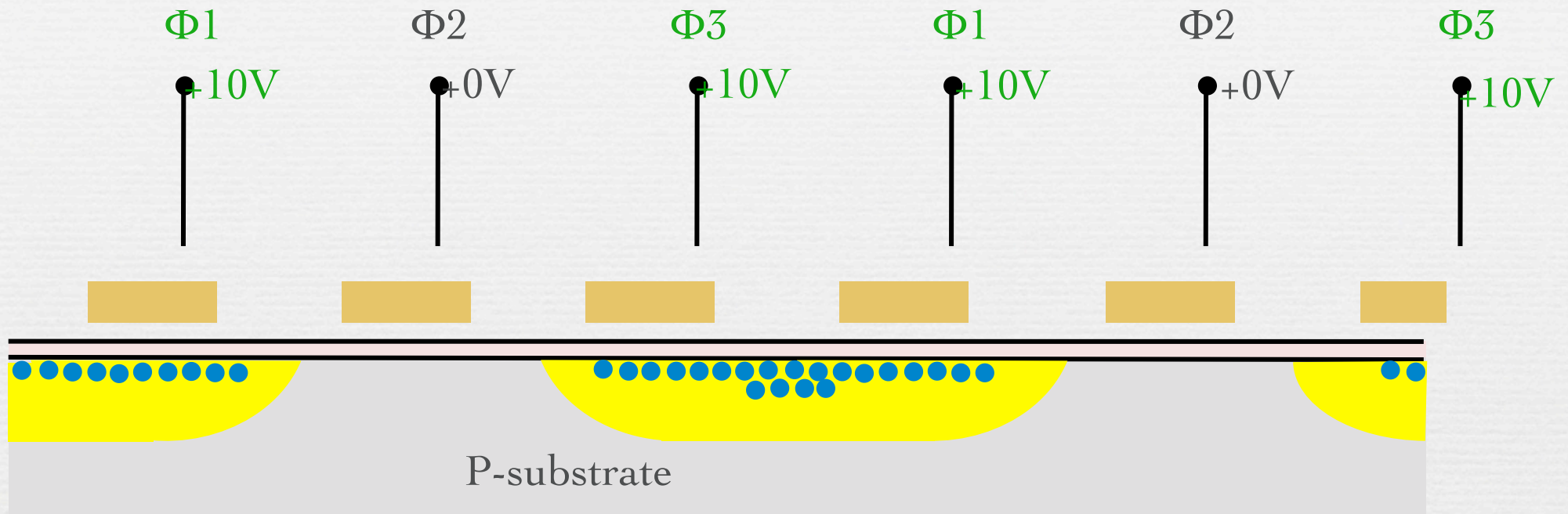
Gratuitous animation showing a CCD “bucket brigade” readout



Gratuitous animation showing a CCD “bucket brigade” readout

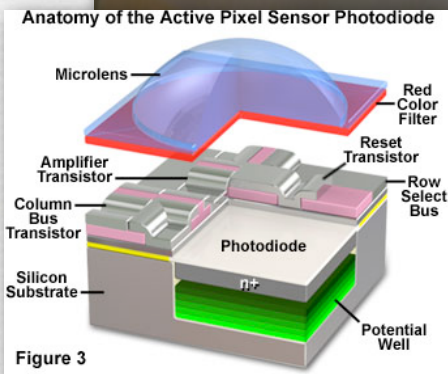
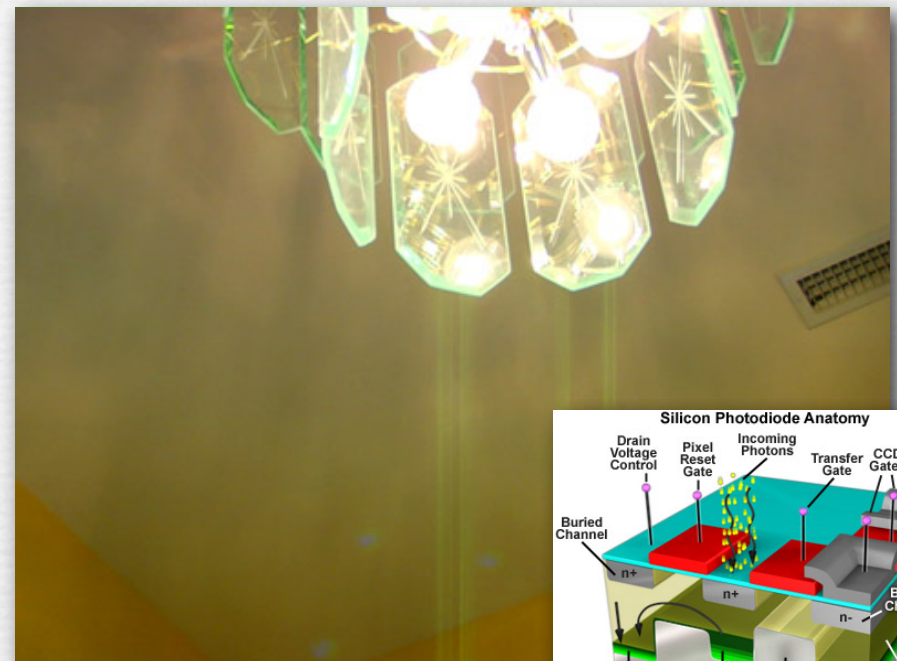
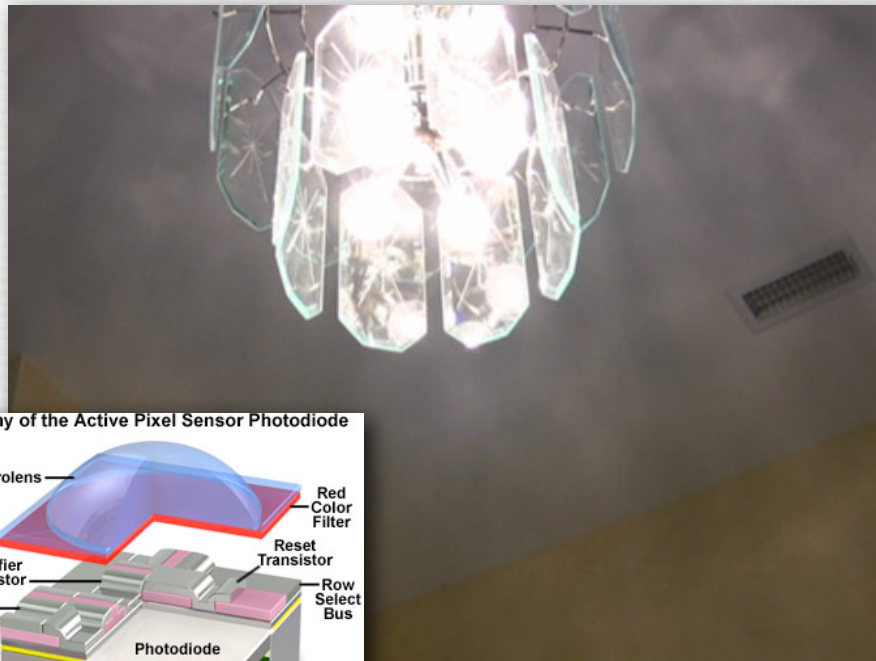


Gratuitous animation showing a CCD “bucket brigade” readout

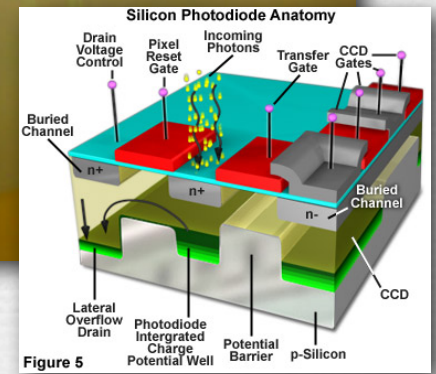


Smearing

(dvxuser.com)



CMOS

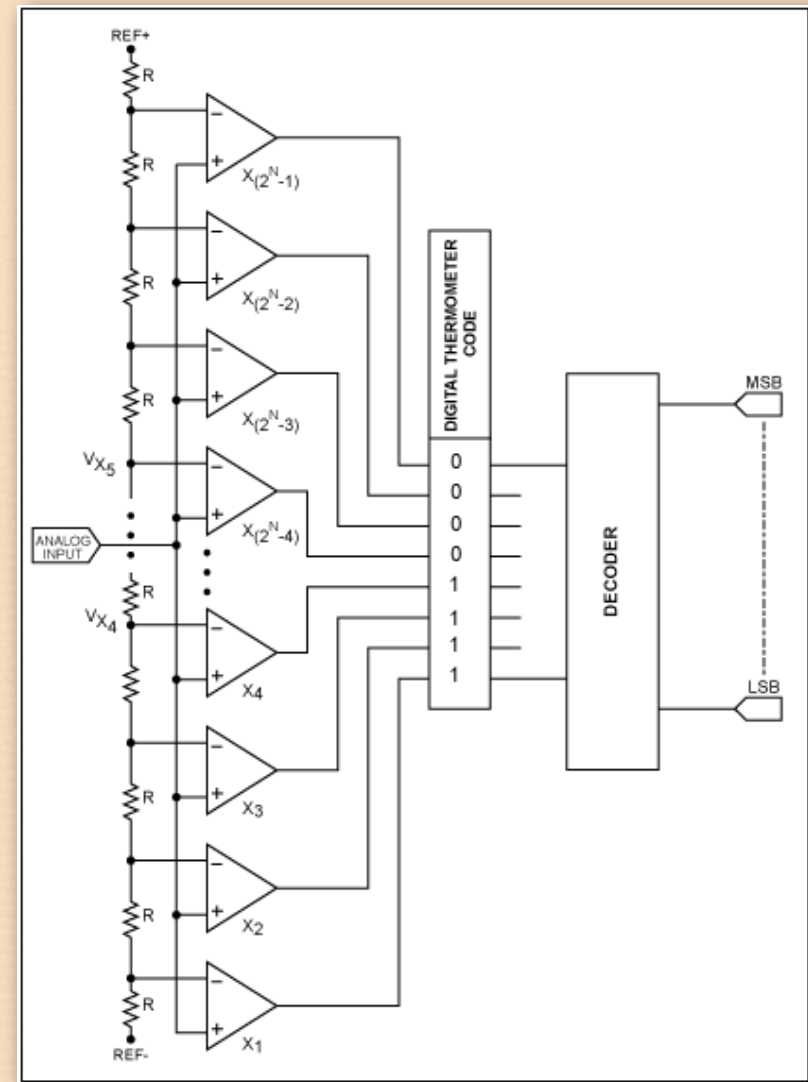


CCD

- ◆ side effect of bucket-brigade readout on CCD sensors
 - along columns, so looks different than blooming
 - only happens if pixels saturate
 - doesn't happen on CMOS sensors

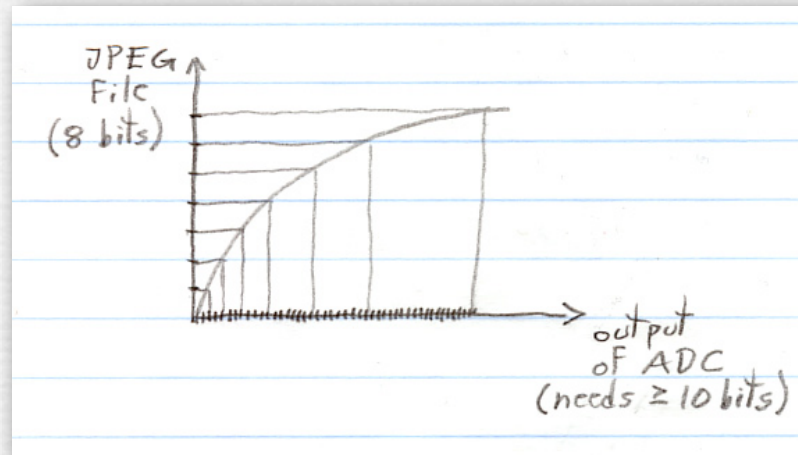
Analog to digital conversion (ADC)

- ◆ flash ADC
 - voltage divider
 - comparators
 - decoder
 - for n bits requires 2^n comparators
- ◆ practical systems use a different architecture: pipelined ADC
- ◆ recent sensors have one ADC per column of pixels



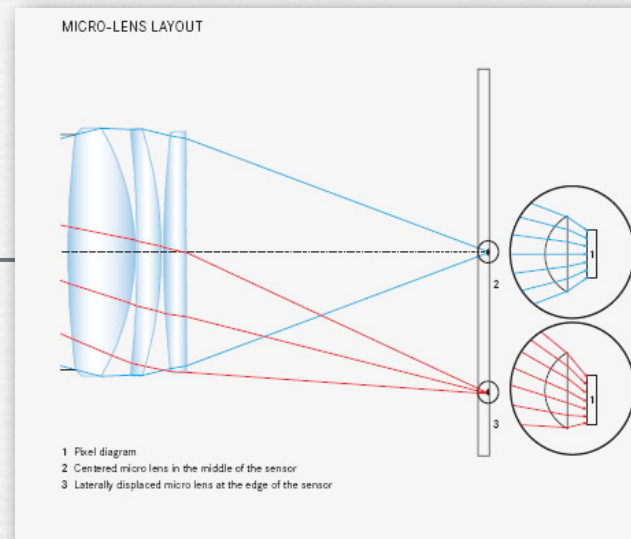
(maxim-ic.com)

ADC must output more bits than JPEG stores (contents of whiteboard)



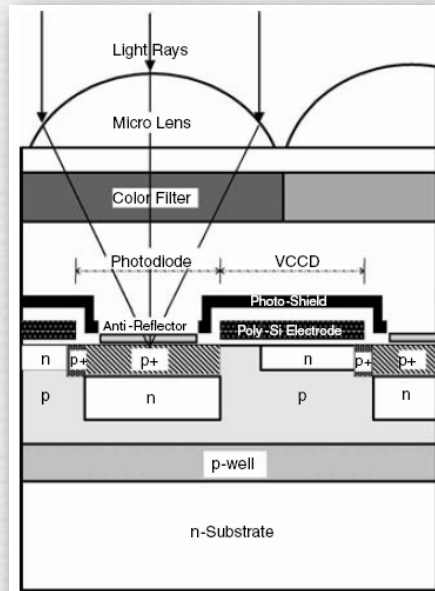
- ◆ converting from analog-to-digital converter (ADC) values (as stored in a RAW file) to the values stored in a JPEG file includes a *tone mapping*; as introduced in the exposure metering lecture, this mapping is typically non-linear and includes a step called *gamma correction*, which has the form $\text{output} = \text{input}^\gamma$ ($0.0 \leq \text{input} \leq 1.0$)
- ◆ since JPEG files only store 8 bits/pixel for each color component, in order for a scene consisting of a smooth gray ramp to fill each of these 256 buckets, the camera's ADC needs to output $\geq \sim 10$ bits; otherwise, dark parts of the ramp will exhibit banding after applying gamma correction and requantizing (integerizing)

Fill factor



Leica M9
(digital full-frame)

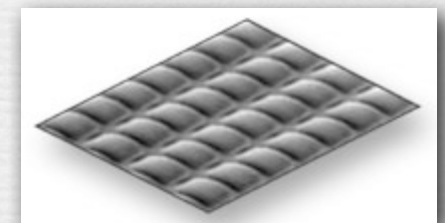
shifted microlenses on M9



on a CCD sensor



on a (front-illuminated) CMOS sensor



oblique view
of microlenses

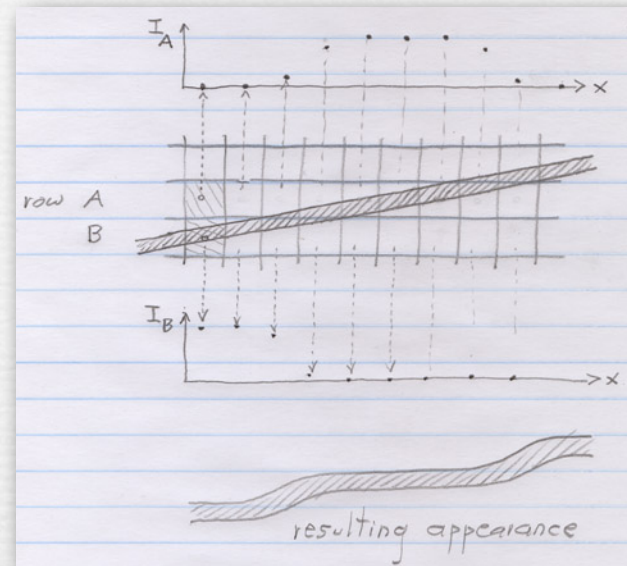
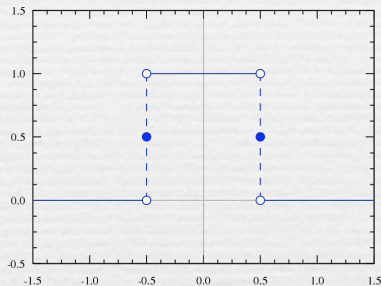
- ◆ fraction of sensor surface available to collect photons
 - can be improved using per-pixel microlenses

Spatio-temporal prefiltering in photography

- ◆ integrating light over an area at each pixel site instead of point sampling serves two functions:
 - captures more photons, to improve *dynamic range*
 - convolves the image with a prefilter, to avoid *aliasing*
- ◆ microlenses gather more light and improve the prefilter
 - microlenses ensure that the *spatial prefilter* is a 2D rect of width roughly equal to the pixel spacing
- ◆ integrating light over the exposure time does the same:
 - captures more photons
 - convolves the scene with a *temporal prefilter*, roughly a 1D rect, creating motion blur if the camera or scene moves

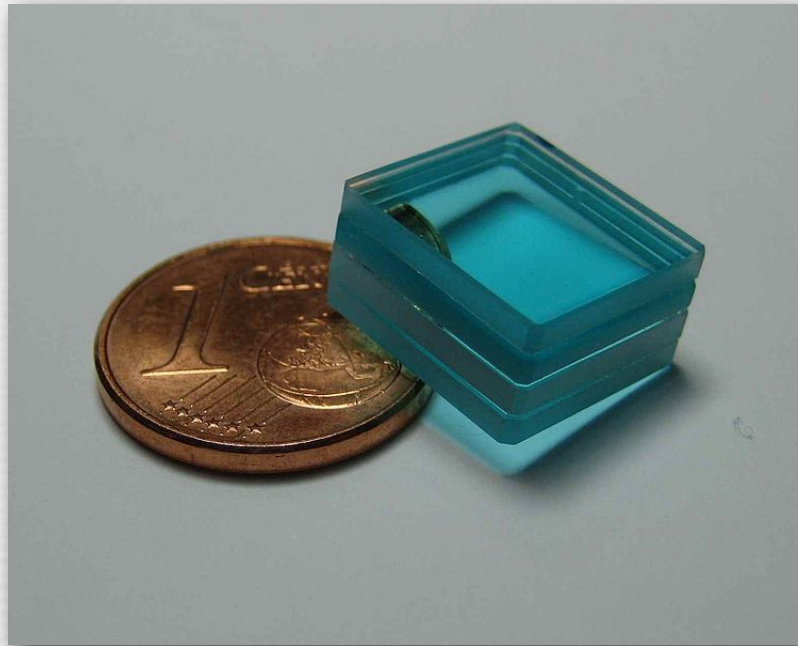
However, a rect is not an ideal pre-filter (contents of whiteboard)

$$\text{rect}(x) = \Pi(x) = \begin{cases} 0 & \text{if } |x| > \frac{1}{2} \\ \frac{1}{2} & \text{if } |x| = \frac{1}{2} \\ 1 & \text{if } |x| < \frac{1}{2} \end{cases}$$



- ◆ as you know, convolving a focused image by a 2D rect (a 1D rect is defined at left above) of width equal to the pixel spacing is equivalent to computing the average intensities in the squares forming each pixel
- ◆ assuming such a 2D rect, a narrow angled stripe object will produce for row A the intensities shown in plot I_A , rising quickly, staying constant for a while, then dropping; the resulting ropey appearance is aliasing
- ◆ if this were a film and each frame were a 1D rect over time, a small object would appear to move quickly, then pause, then move again

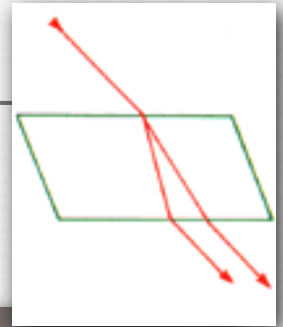
Antialiasing filters



infrared & antialiasing filter



birefringence in a calcite crystal

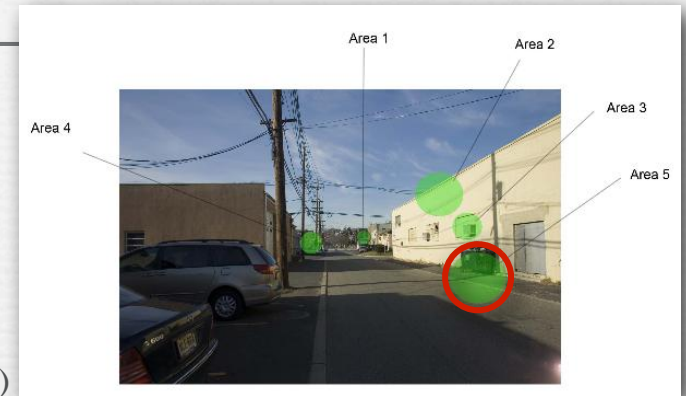


- ◆ improves on non-ideal prefilter, even with microlenses
- ◆ typically two layers of birefringent material
 - splits 1 ray into 4 rays
 - operates like a 4-tap discrete convolution filter kernel

Removing the antialiasing filter

- ◆ “hot rodding” your digital camera
 - \$450 + shipping

(maxmax.com)



anti-aliasing filter removed

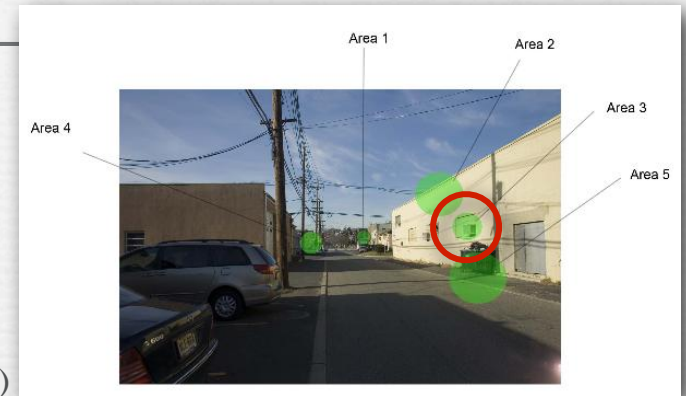


normal

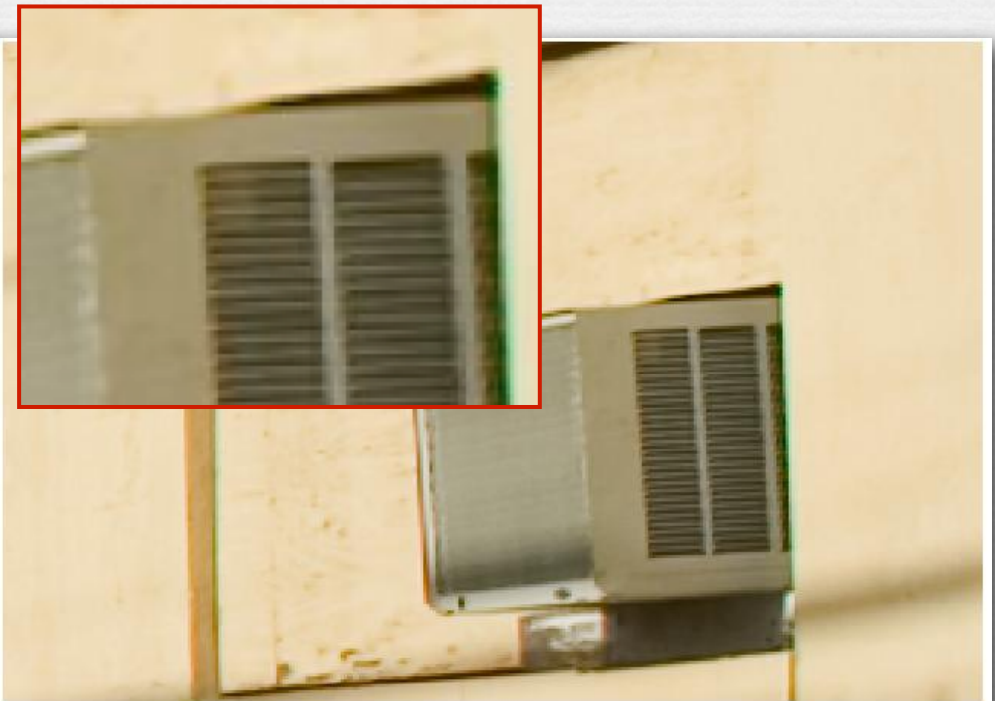
Removing the antialiasing filter

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anti-aliasing filter removed



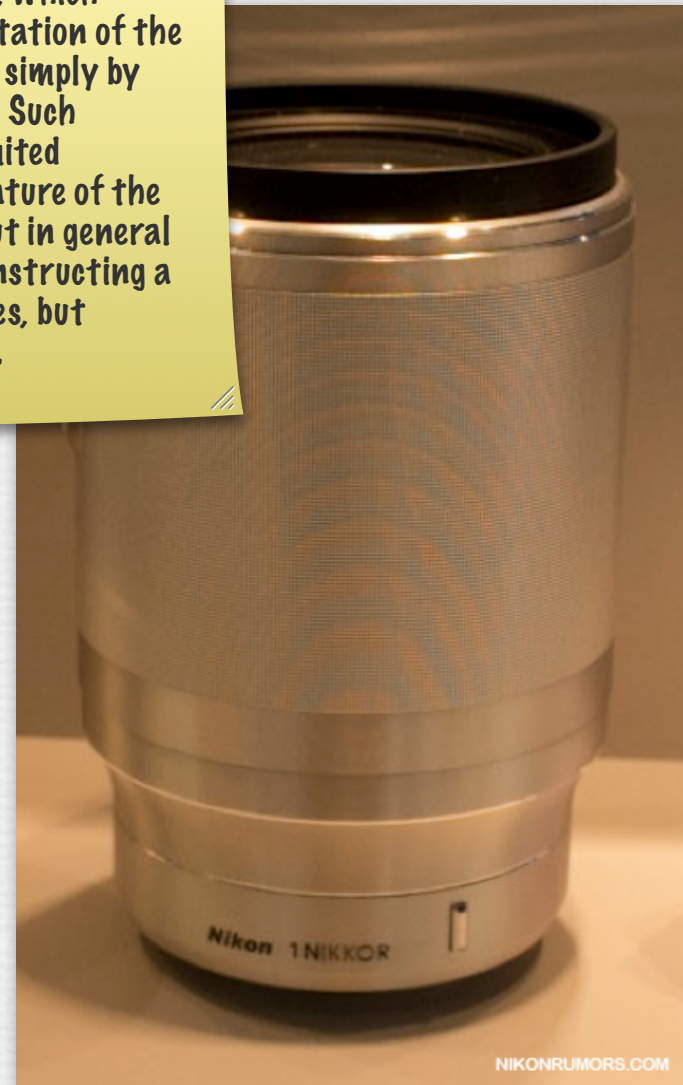
normal

Cameras without antialiasing filters

As discussed during lecture, since aliasing can contain arbitrarily low frequencies, which depend on the positioning and orientation of the sampling grid, you cannot remove it simply by blurring the sampled aliased image. Such blurring is called postfiltering. In limited situations, if you know the exact nature of the aliasing, it is possible to reduce it, but in general postfiltering is appropriate for reconstructing a continuous function from its samples, but cannot be used to eliminate aliasing.



Nikon D800



Nikon D800E

Recap

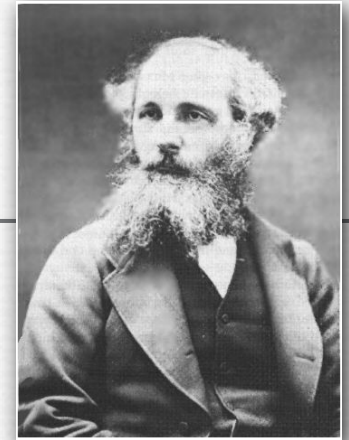
- ◆ photons strike a sensor and are converted to electrons
 - performance factors include *quantum efficiency* and *pixel size*
- ◆ sensors are typically CCD or CMOS
 - both can suffer *blooming*; only CCDs can suffer *smearing*
- ◆ integrating light over an area serves two functions
 - capturing more photons, to improve *dynamic range*
 - convolving the image with a prefilter, to avoid *aliasing*
 - to ensure that the area spans pixel spacing, use *microlenses*
 - to improve further on the prefilter, use an *antialiasing filter*
- ◆ integrating light over time serves the same two functions
 - captures more photons, but may produce motion blur

Questions?

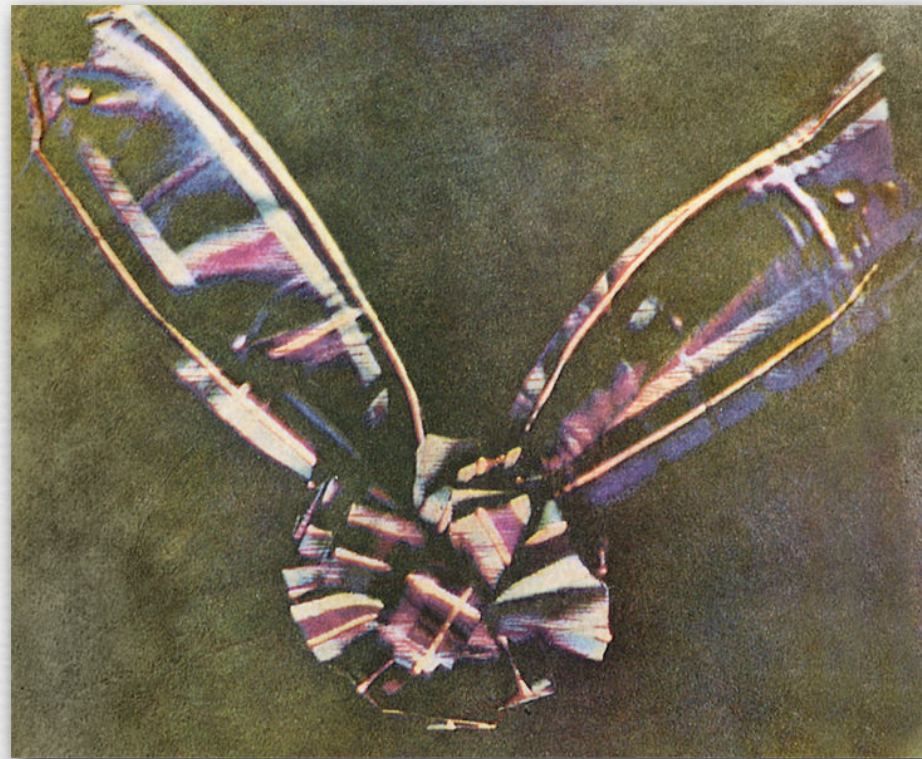
Color

- ◆ silicon detects all visible frequencies well
- ◆ can't differentiate wavelengths after photon knocks an electron loose
 - all electrons look alike
- ◆ must select desired frequencies before light reaches photodetector
 - block using a filter, or separate using a prism or dichroic
- ◆ 3 spectral responses is enough
 - a few consumer cameras record 4
- ◆ silicon is also sensitive to near infrared (NIR)
 - most sensors have an IR filter to block it
 - to make a NIR camera, remove this filter

Historical interlude



Q. Who made the first color photograph?



(wikipedia)

- ◆ James Clerk Maxwell, 1861
 - of Maxwell's equations
 - 3 images, shot through filters, then simultaneously projected

Historical interlude



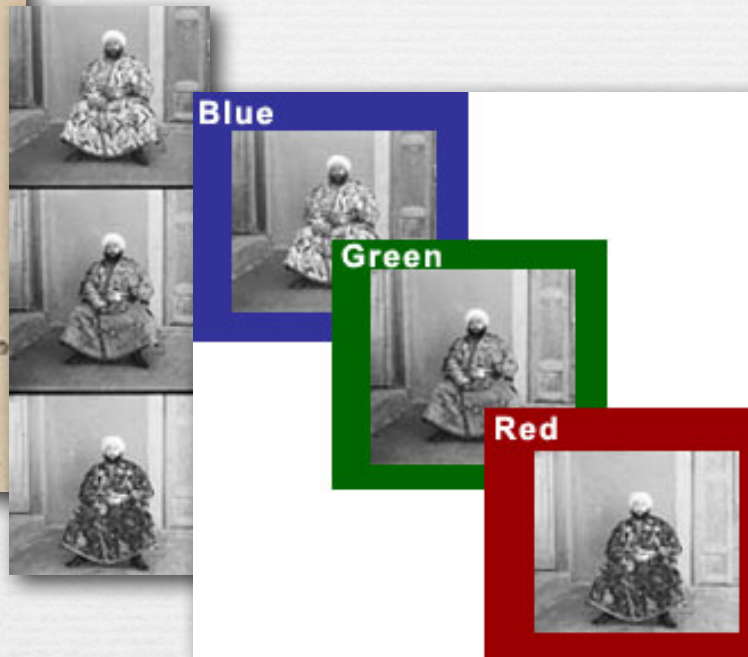
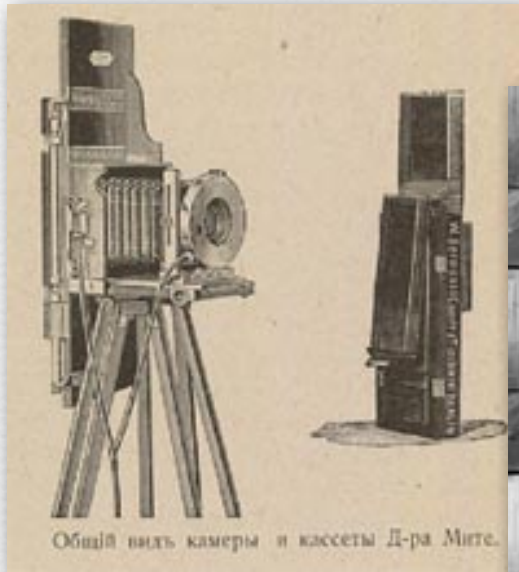
Q. Who made the first color print?



(wikipedia)

- ◆ Louis Arthur Ducos du Hauron, 1877
 - 3 images, shot through filters, printed with color inks
 - he experimented with RGB and CMY

Sergey Prokudin-Gorsky



- shot sequentially through R, G, B filters
- simultaneous projection provided good saturation, but available printing technology did not
- digital restoration lets us see them in full glory...



Sergey Prokudin-Gorsky, Alim Khan, emir of Bukhara (1911)



Sergey Prokudin-Gorsky,
Pinkhus Karlinskii, Supervisor of the Chernigov Floodgate (1919)

First color movie technology?



(wikipedia)

A Visit to the Seaside (1908)

- ◆ George Albert Smith's Kinemacolor, 1906
 - alternating red and green filters, total of 32 fps
 - projected through alternating red and green filters

Technicolor



Toll of the Sea (1922)



Phantom of the Opera (1925)

- ◆ beam splitter leading through 2 filters to two cameras
- ◆ 2 strips of film, cemented together for projection

Technicolor



Disney's Flowers and Trees (1932)



Wizard of Oz (1939)

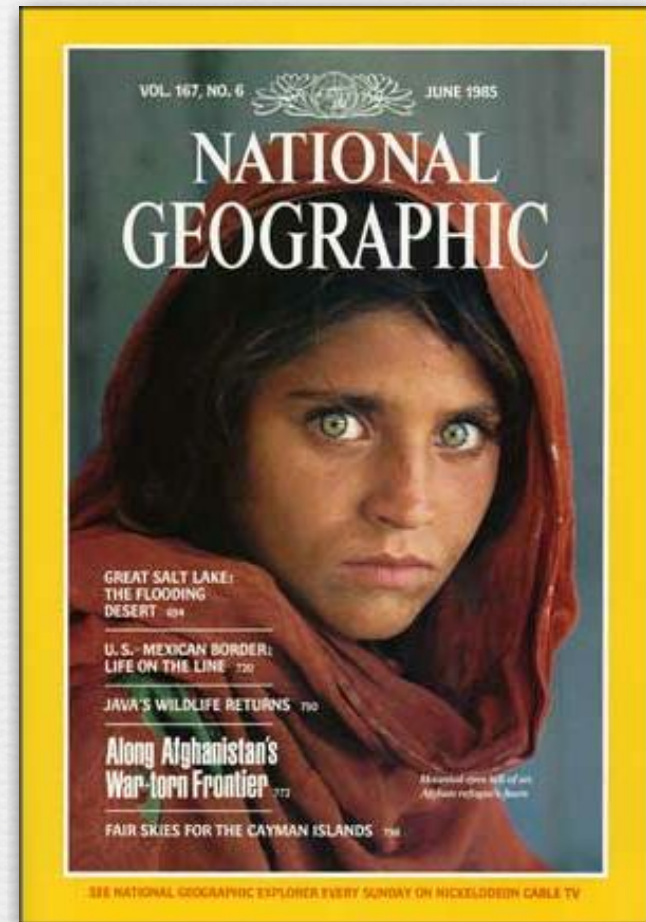
- ◆ 3 filters, 3 cameras, 3 strips of film
- ◆ better preserved than single-strip color movies of 1960s!

First consumer color film?

(wikipedia)



Picadilly Circus, 1949



- ◆ Kodachrome, 1935
 - no longer available

First color television broadcast?



(Beatles in 1964 was in B&W)



started broadcasting in color in 1965

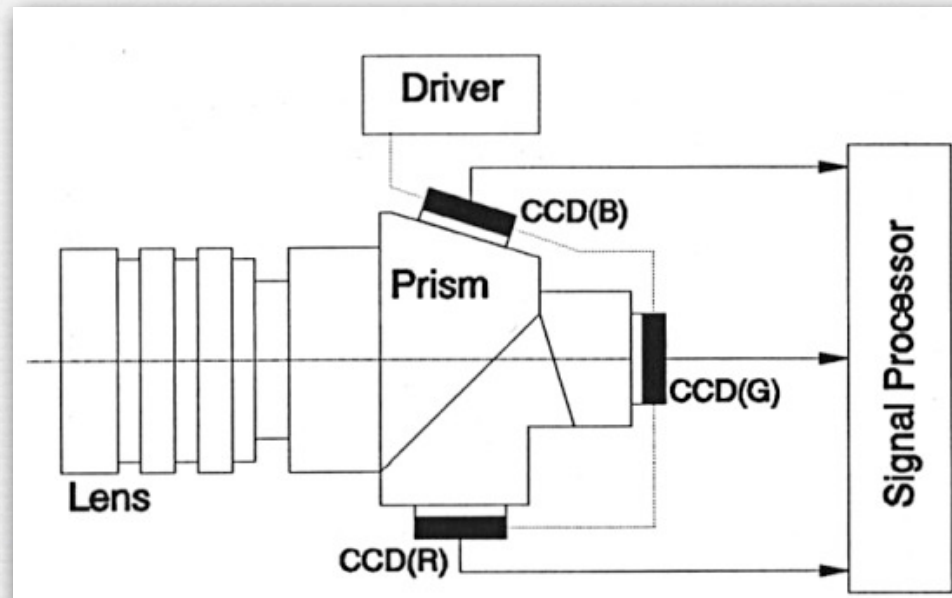
◆ competing standards

- U.S. NTSC 525-line, 30fps, interlaced
- Europe PAL 625-line, 25fps, interlaced
- France SECAM 625-line, 25fps, interlaced

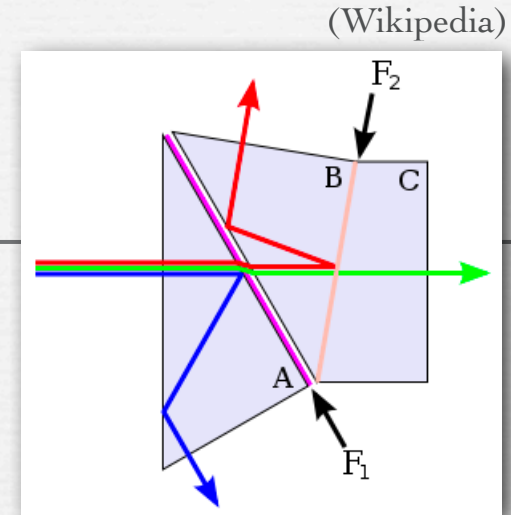
Color sensing technologies

- ◆ field-sequential - just covered
- ◆ 3-chip
- ◆ vertically stacked
- ◆ color filter arrays

3-chip cameras



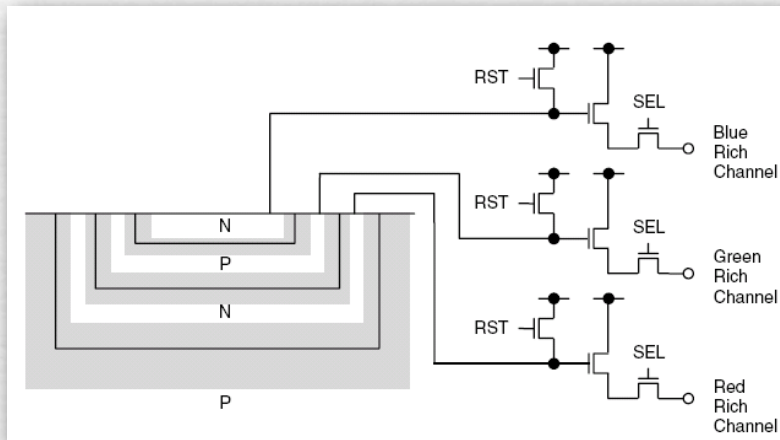
(Theuwissen)



(Wikipedia)

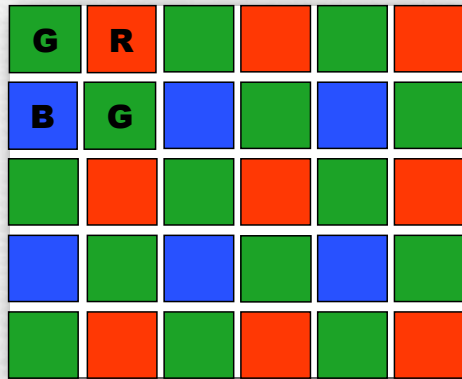
- ◆ high-quality video cameras
- ◆ prism & dichroic mirrors split the image into 3 colors, each routed to a separate sensor (typically CCD)
- ◆ no light loss, as compared to filters (which absorb light)
- ◆ expensive, and complicates lens design

Foveon stacked sensor

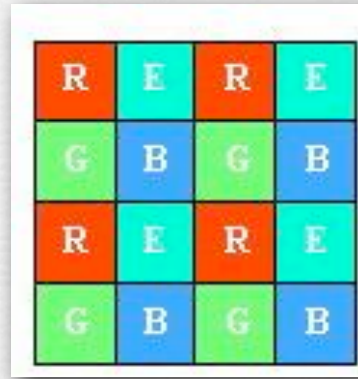


- ◆ longer wavelengths penetrate deeper into silicon, so arrange a set of vertically stacked detectors
 - top gets mostly blue, middle gets green, bottom gets red
 - no control over spectral responses, so requires processing
- ◆ fewer moiré artifacts than color filter arrays + demosaicking
 - but possibly worse noise performance, especially in blue

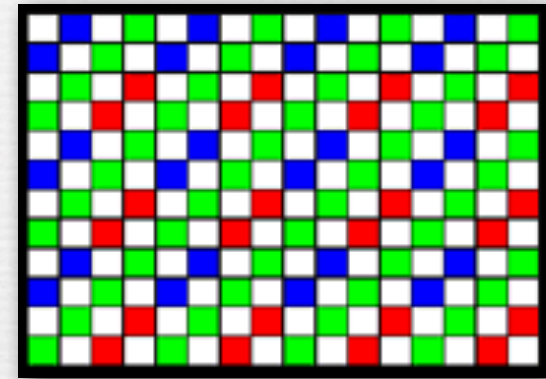
Color filter arrays



Bayer pattern



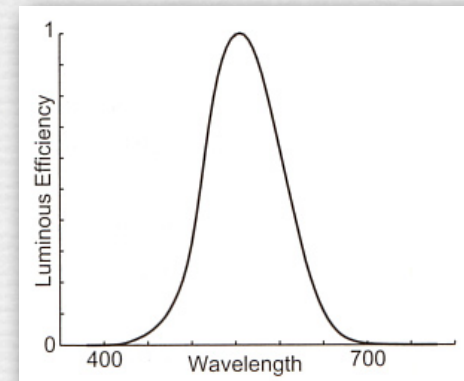
Sony RGB+E
better color



Kodak RGB+C
more dynamic range

♦ Why more green pixels than red or blue?

- because humans are most sensitive in the middle of the visible spectrum
- sensitivity given by the human luminous efficiency curve



(Stone)

Example of Bayer mosaic image



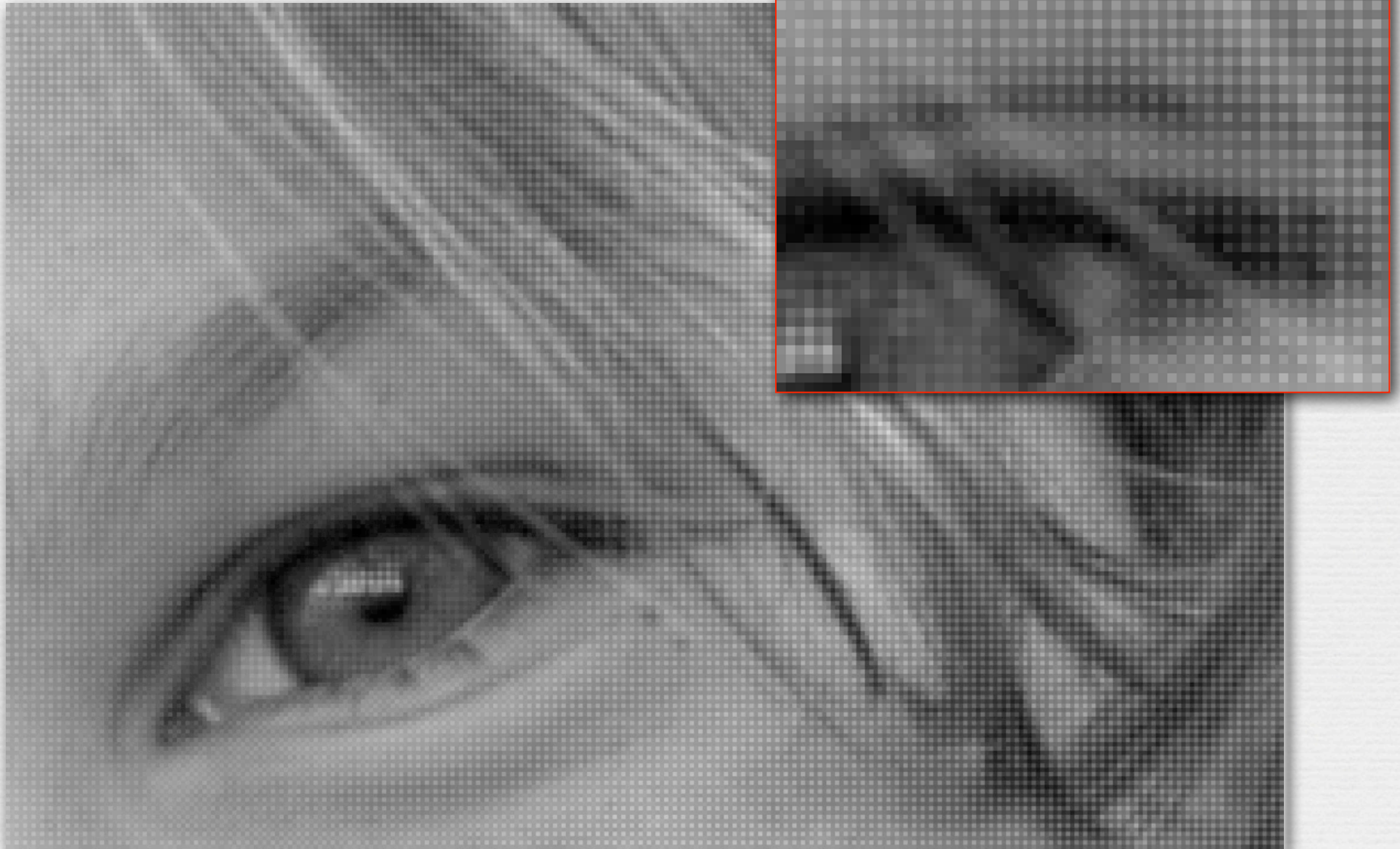
Small fan at
Stanford women's
soccer game

(Canon 1D III)

Example of Bayer mosaic image

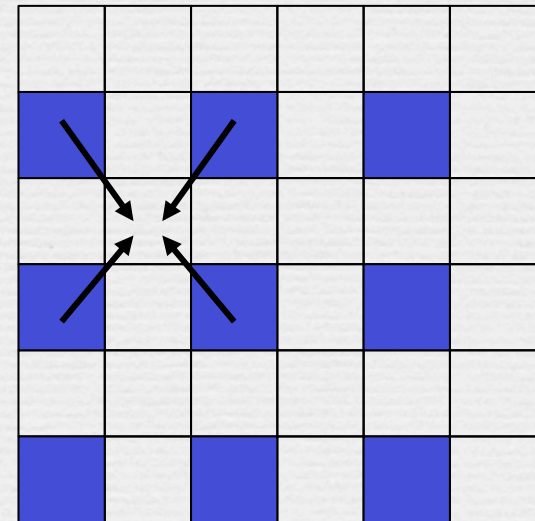
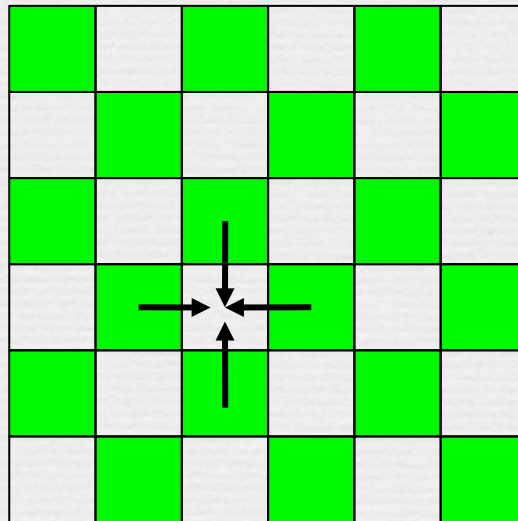
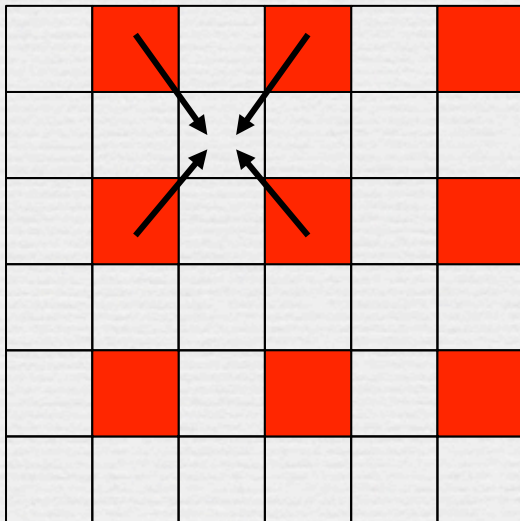


Before demosaicking (dcraw -d)



Demosaicking

- ◆ linear interpolation
 - average of the 4 nearest neighbors of the same color
- ◆ cameras typically use more complicated scheme
 - try to avoid interpolating across contrasty edges
 - demosaicking is often combined with denoising, sharpening...
- ◆ due to demosaicking, $2/3$ of your data is “made up”!



Recap

- ◆ color can only be measured by selecting certain light frequencies to reach certain sensor sites or layers
 - selection can employ *filters* or *dichroics* or *penetration depth*
- ◆ measuring color requires making a tradeoff
 - *field sequential* cameras trade off capture duration
 - *3-chip* cameras trade off weight and expense
 - *vertically stacked* sensors (Foveon) trade off noise (in blue)
 - *color filter array* (e.g. Bayer) trades off spatial resolution

Questions?

Slide credits

◆ Brian Curless

◆ Eddy Talvala

◆ Abbas El Gamal

◆ Theuwissen A., *Solid-State Imaging with Charge-Coupled Devices*, Kluwer Academic Publishers, 1995.