
影像演算法介紹

Lecture Notes: Introduction and Overview

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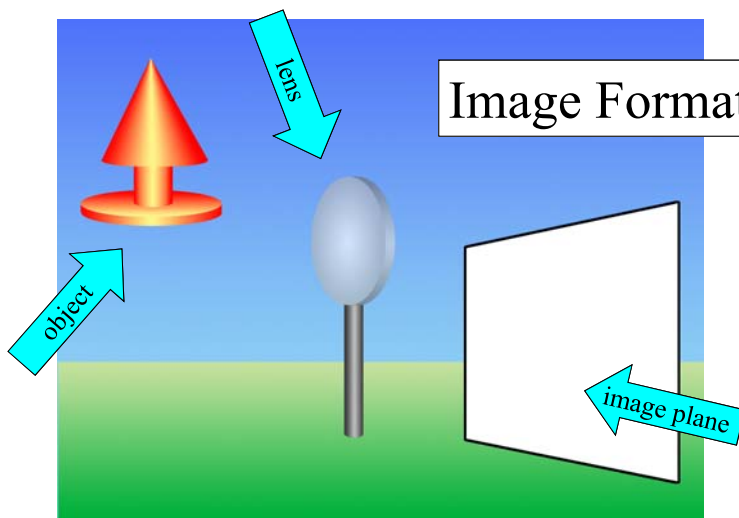
Introduction and Overview

This presentation is an
overview of some of the
ideas and techniques to be
covered during the course.

Topics

1. image formation
2. point processing and equalization
3. color perception and transformation
4. Fourier transform
5. convolution and image filtering
6. frequency filtering
7. noise reduction
8. recent advances in image processing and computer vision

Image Formation



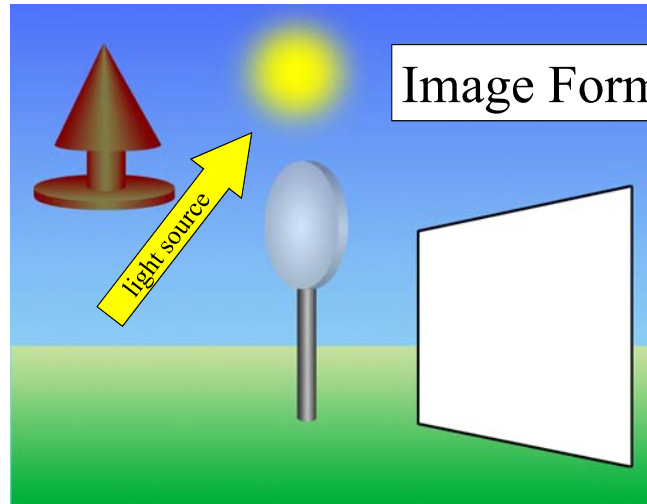


Image Formation

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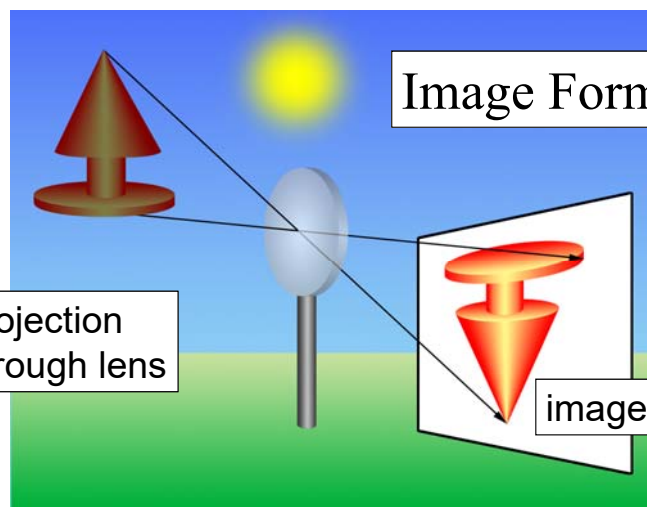


Image Formation

projection
through lens

image of object

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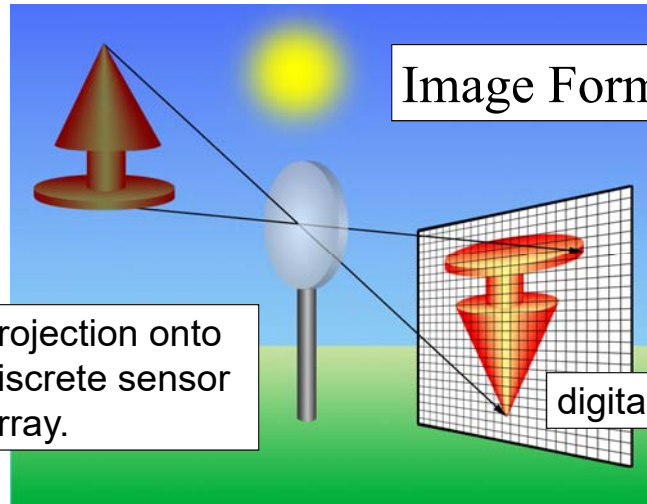


Image Formation

projection onto
discrete sensor
array.

digital camera

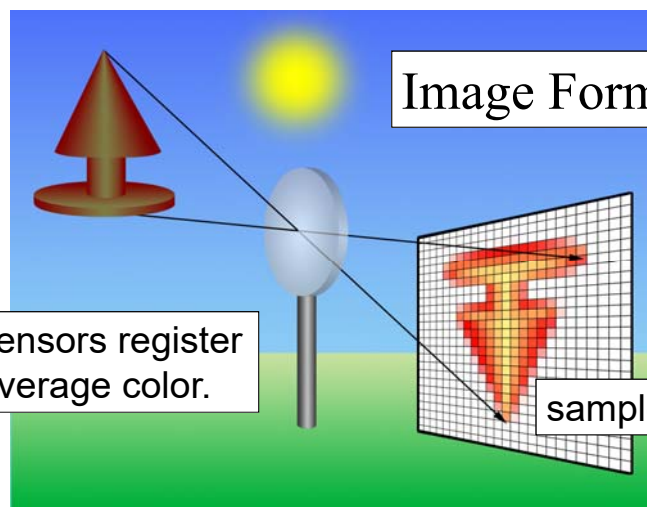
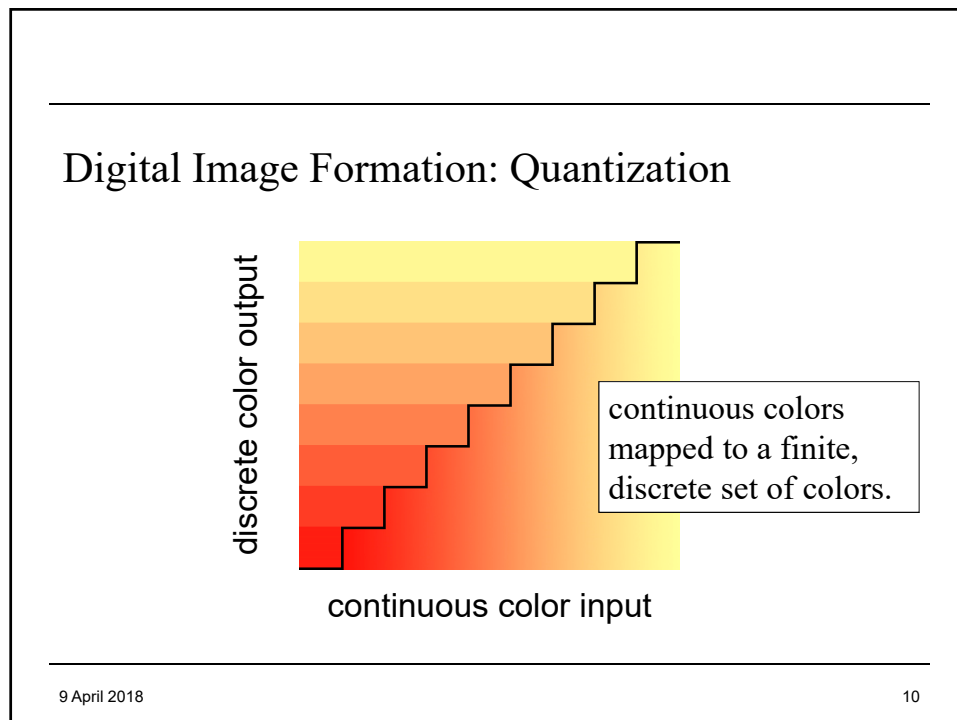
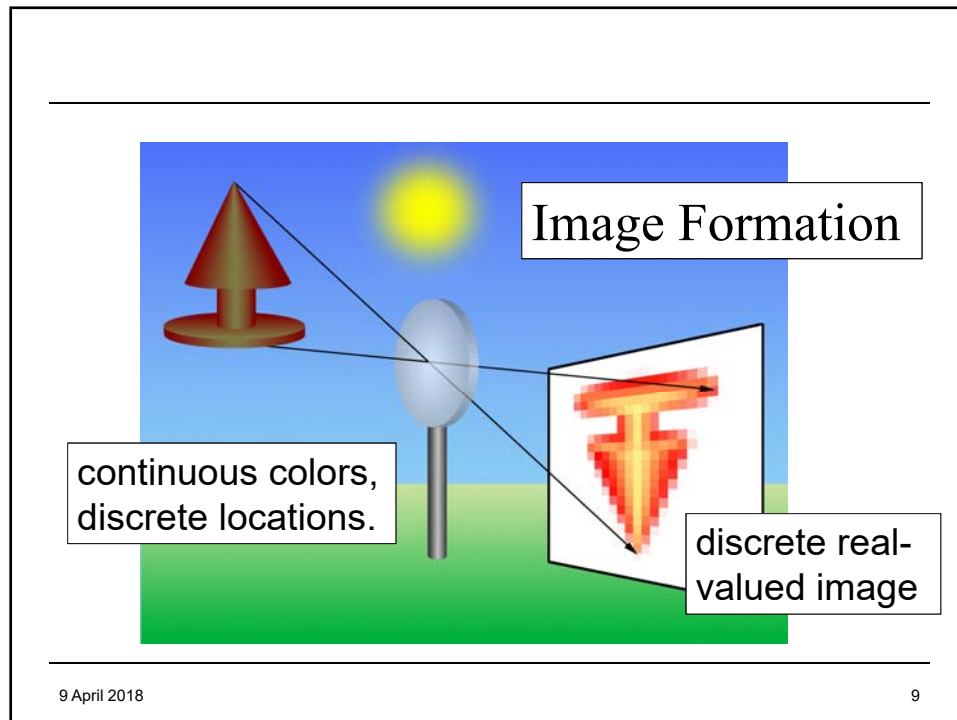


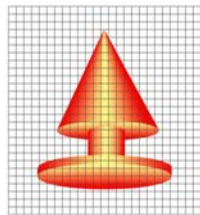
Image Formation

sensors register
average color.

sampled image



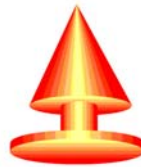
Sampling and Quantization



real image



sampled



quantized

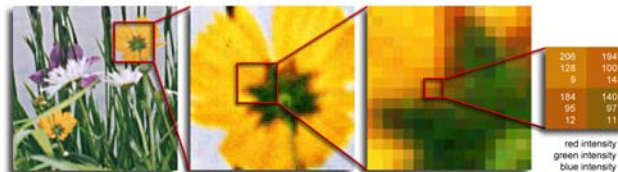


sampled &
quantized

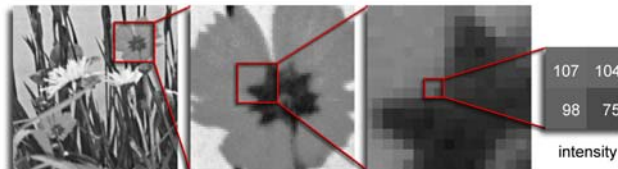
Digital Image

Color images have 3 values per pixel; monochrome images have 1 value per pixel.

a grid of squares,
each of which
contains a single
color

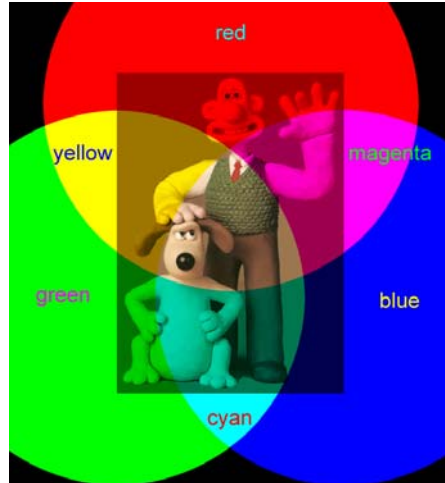


each square is
called a pixel (for
picture element)

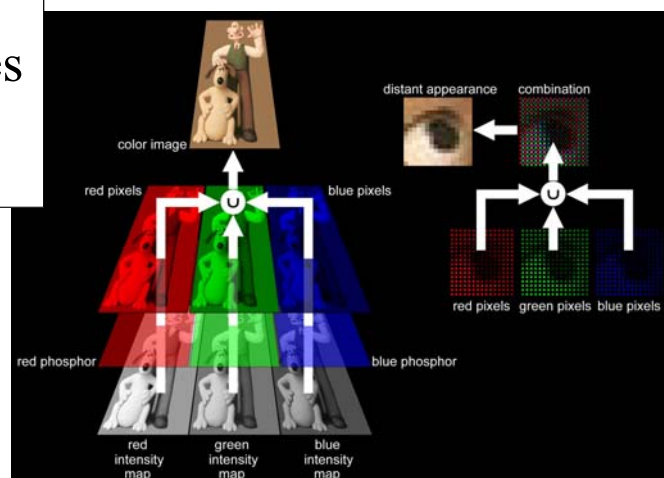


Color Images

- m Are constructed from three intensity maps.
- m Each intensity map is projected through a color filter (e.g., red, green, or blue, or cyan, magenta, or yellow) to create a monochrome image.
- m The intensity maps are overlaid to create a color image.
- m Each pixel in a color image is a three element vector.



Color Images On a CRT



Point Processing



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Color Processing

requires some
knowledge of
how we see
colors

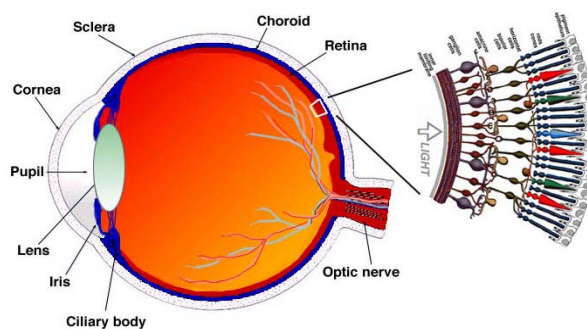


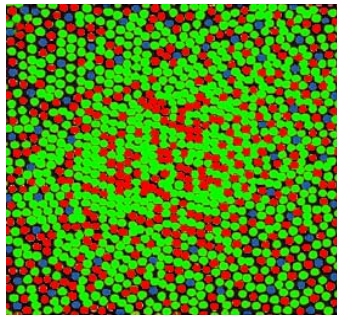
Fig. 1.1. A drawing of a section through the human eye with a schematic enlargement of the retina.

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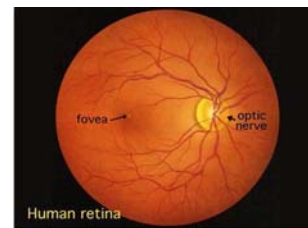
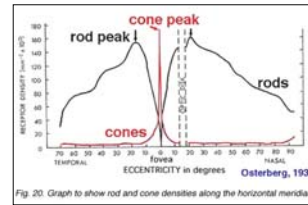
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Eye's Light Sensors

cone density near fovea

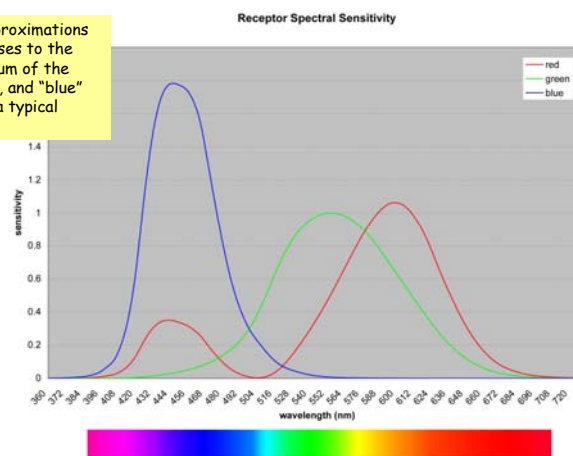


$\#(\text{blue}) \ll \#(\text{red}) < \#(\text{green})$



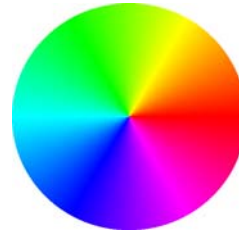
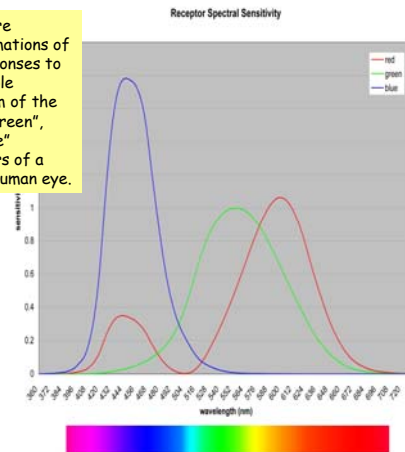
Color Sensing / Color Perception

These are approximations of the responses to the visible spectrum of the "red", "green", and "blue" receptors of a typical human eye.



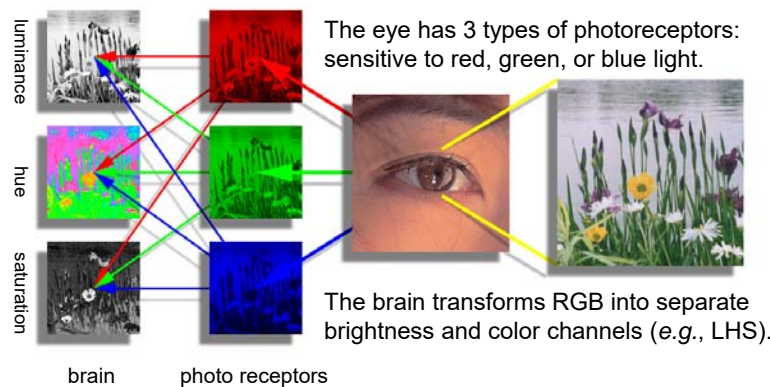
Color Sensing / Color Perception

These are approximations of the responses to the visible spectrum of the "red", "green", and "blue" receptors of a typical human eye.



The simultaneous red + blue response causes us to perceive a continuous range of hues on a circle. No hue is greater than or less than any other hue.

Color Sensing / Color Perception



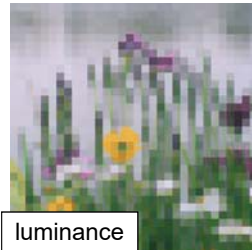
Color Perception

16x pixelization of:

luminance and chrominance (hue+saturation) are perceived with different resolutions, as are red, green and blue.



all bands



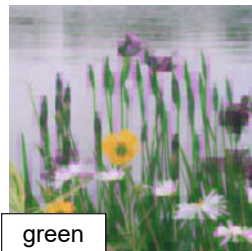
luminance



chrominance



red



green



blue

Color Perception

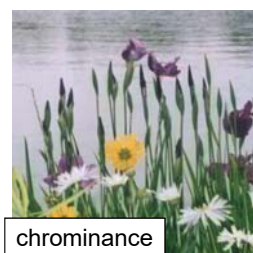
16x pixelization of:



all bands



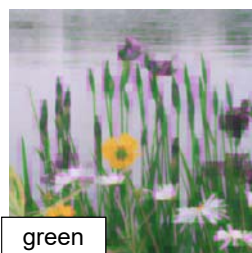
luminance



chrominance



red



green



blue

Color Balance and Saturation

Uniform changes in color components result in change of tint.

E.g., if all G pixel values are multiplied by $\alpha > 1$ then the image takes a green cast.



Color Transformations

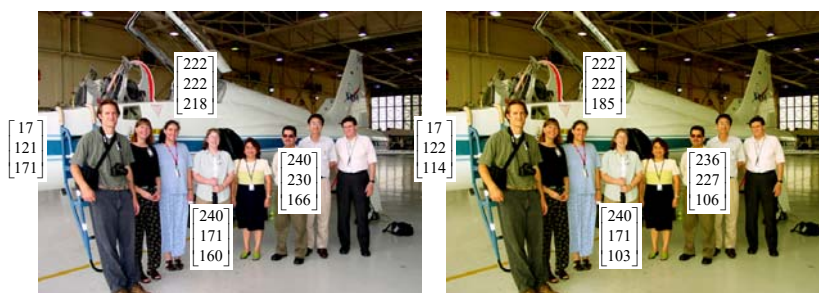


Image aging: a transformation, Φ , that mapped:

$$\begin{bmatrix} 17 \\ 122 \\ 114 \end{bmatrix} = \Phi \left(\begin{bmatrix} 17 \\ 121 \\ 171 \end{bmatrix} \right) \quad \begin{bmatrix} 222 \\ 222 \\ 185 \end{bmatrix} = \Phi \left(\begin{bmatrix} 222 \\ 222 \\ 218 \end{bmatrix} \right) \quad \begin{bmatrix} 240 \\ 171 \\ 103 \end{bmatrix} = \Phi \left(\begin{bmatrix} 240 \\ 171 \\ 160 \end{bmatrix} \right) \quad \begin{bmatrix} 236 \\ 227 \\ 106 \end{bmatrix} = \Phi \left(\begin{bmatrix} 240 \\ 230 \\ 166 \end{bmatrix} \right)$$

The 2D Fourier Transform of a Digital Image

Let $I(r,c)$ be a single-band (intensity) digital image with R rows and C columns. Then, $I(r,c)$ has Fourier representation

$$I(r,c) = \sum_{u=0}^{R-1} \sum_{v=0}^{C-1} I(u,v) e^{+i2\pi\left(\frac{ur}{R} + \frac{vc}{C}\right)},$$

where

$$I(u,v) = \frac{1}{RC} \sum_{r=0}^{R-1} \sum_{c=0}^{C-1} I(r,c) e^{-i2\pi\left(\frac{ur}{R} + \frac{vc}{C}\right)}$$

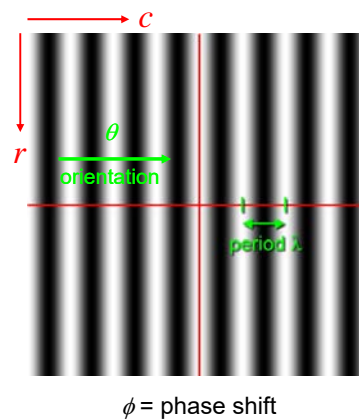
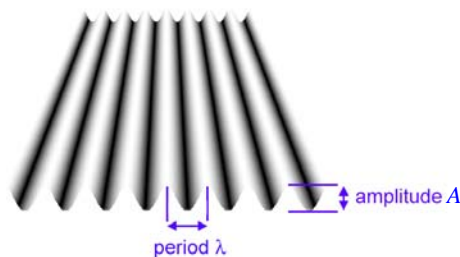
are the $R \times C$ Fourier coefficients.

these complex exponentials are 2D sinusoids.

2D Sinusoids:

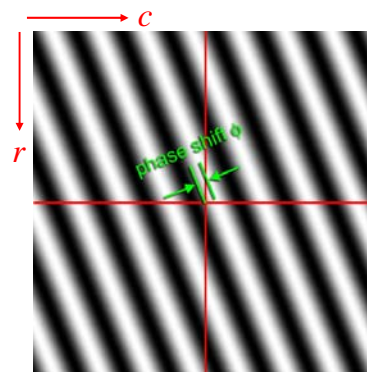
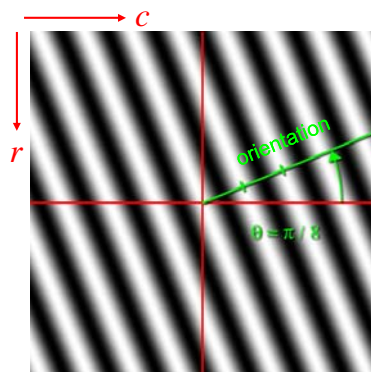
$$I(r,c) = \frac{A}{2} \left\{ \cos \left[\frac{2\pi}{\lambda} \left(\frac{c}{C} \cos \theta - \frac{r}{R} \sin \theta \right) + \phi \right] + 1 \right\}$$

... are plane waves with grayscale amplitudes, periods in terms of lengths, ...

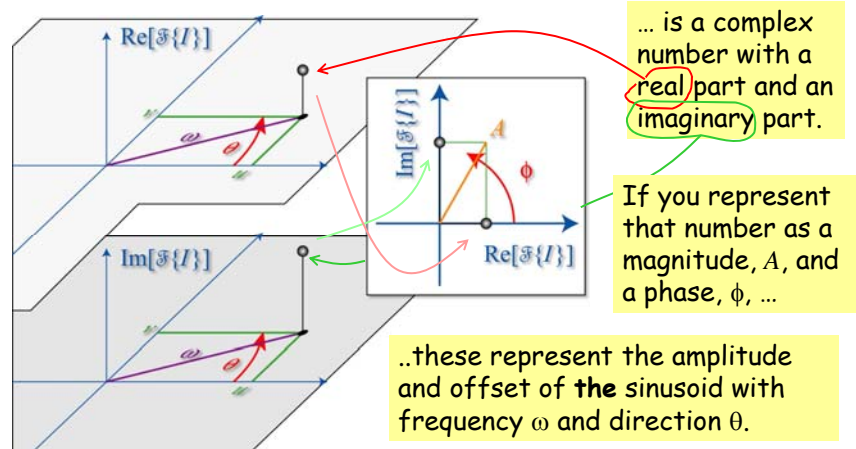


2D Sinusoids:

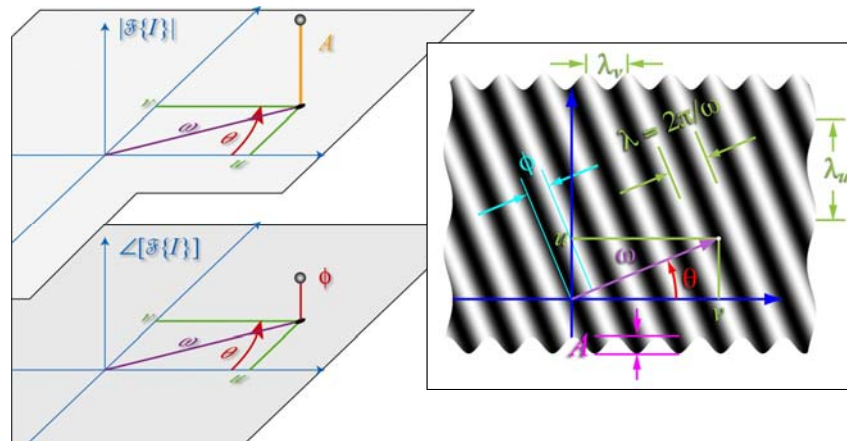
... specific orientations,
and phase shifts.



The Value of a Fourier Coefficient ...



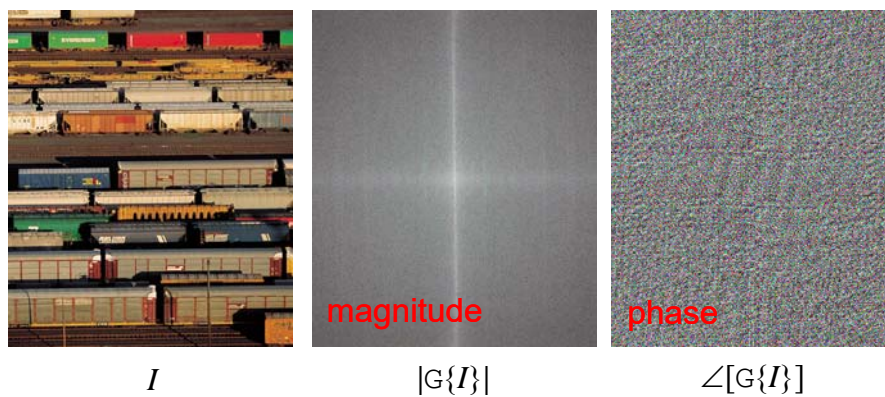
The Sinusoid from the Fourier Coeff. at (u,v)



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The Fourier Transform of an Image

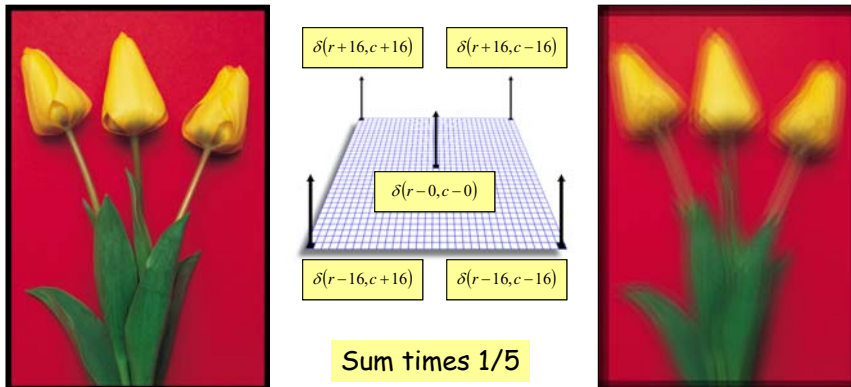


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Convolution

Sums of shifted and weighted copies of images or Fourier transforms.



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Convolution Property of the Fourier Transform

Let functions $f(r, c)$ and $g(r, c)$ have Fourier Transforms $F(u, v)$ and $G(u, v)$.

Then,

$$\mathbf{F}\{f * g\} = F \cdot G.$$

Moreover,

$$\mathbf{F}\{f \cdot g\} = F * G.$$

* represents convolution

· represents pointwise multiplication

Then, a spatial convolution can be computed by

$$f * g = \mathbf{F}^{-1}\{F \cdot G\}.$$

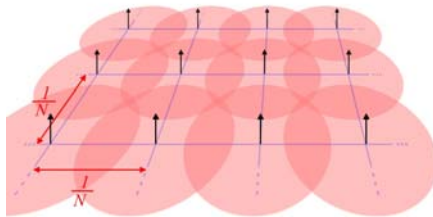
The Fourier Transform of a product equals the convolution of the Fourier Transforms. Similarly, the Fourier Transform of a convolution is the product of the Fourier Transforms

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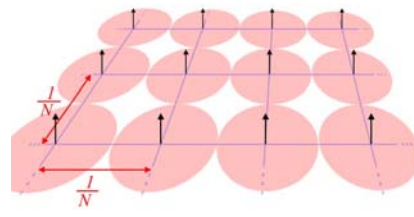
Sampling, Aliasing, & Frequency Convolution

$$\text{samp}_{1/N}(u,v) = \sum_{j=-\infty}^{\infty} \sum_{k=-\infty}^{\infty} \delta(u - \frac{j}{N}) \delta(v - \frac{k}{N})$$



aliasing (the jaggies)

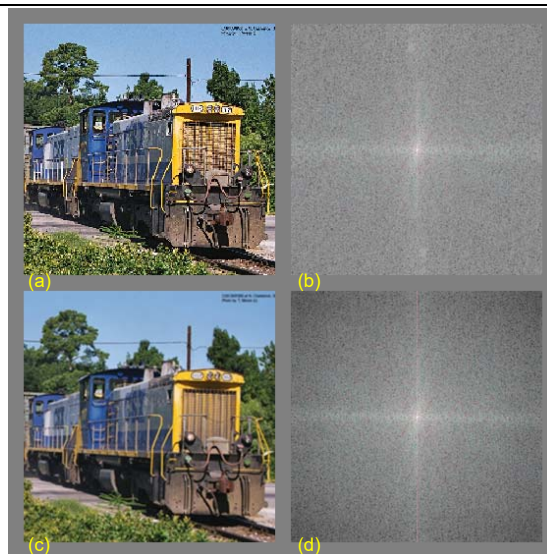
$$\text{samp}_{1/N}(u,v) = \sum_{j=-\infty}^{\infty} \sum_{k=-\infty}^{\infty} \delta(u - \frac{j}{N}) \delta(v - \frac{k}{N})$$



no aliasing (smooth lines)

Sampling, Aliasing, & Frequency Convolution

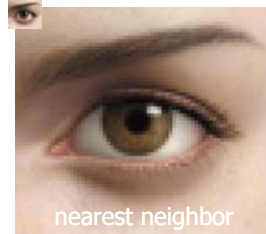
- (a) aliased
- (b) power spectrum
- (c) unaliased
- (d) power spectrum



Resampling

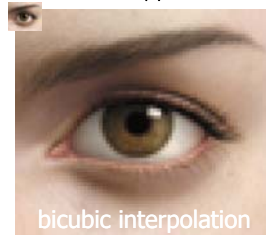


(resizing)

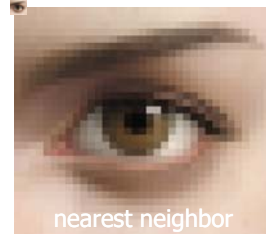


nearest neighbor

8x

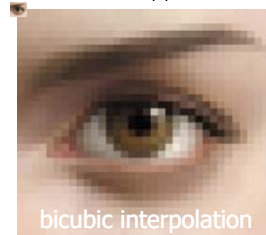


bicubic interpolation



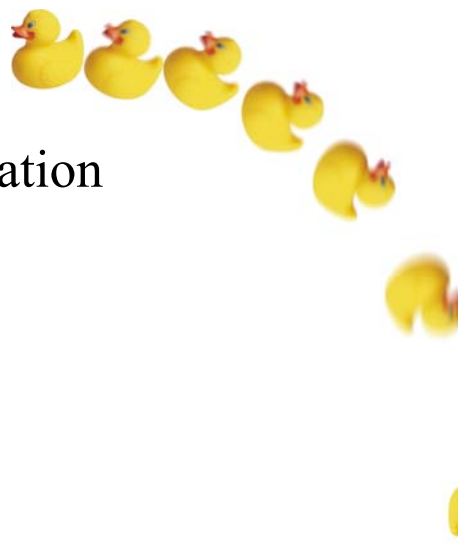
nearest neighbor

16x



bicubic interpolation

Rotation



and motion blur

Frequency Domain (FD) Filtering

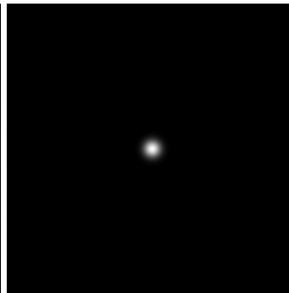
Image size: 512x512
SD filter sigma = 8



Original Image



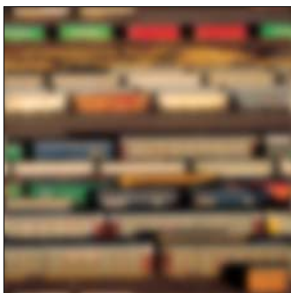
Power Spectrum



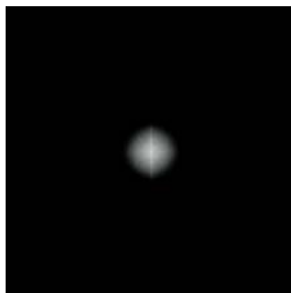
Gaussian LPF in FD

FD Filtering: Lowpass

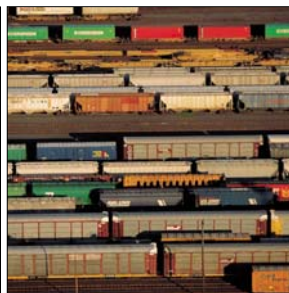
Image size: 512x512
SD filter sigma = 8



Filtered Image



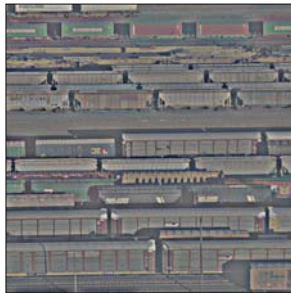
Filtered Power Spectrum



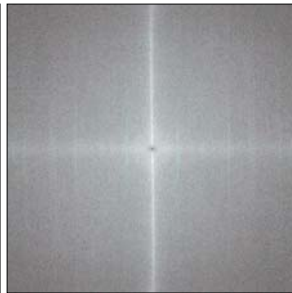
Original Image

FD Filtering: Highpass

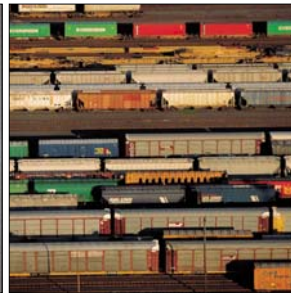
Image size: 512x512
FD notch sigma = 8



Filtered Image



Filtered Power Spectrum

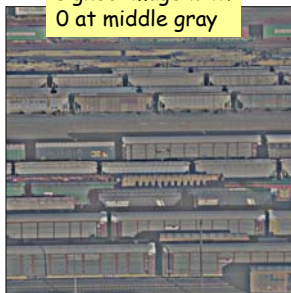


Original Image

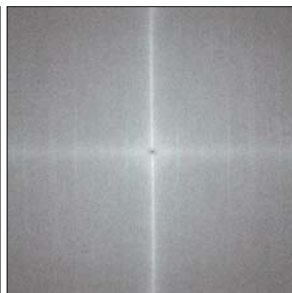
FD Filtering: Highpass

Image size: 512x512
FD notch sigma = 8

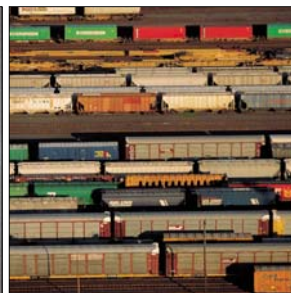
signed image with
0 at middle gray



Filtered Image



Filtered Power Spectrum



Original Image

Spatial Filtering



blurred



original



sharpened

Spatial Filtering



bandpass
filter



original



unsharp
masking

Spatial Filtering

signed image with
0 at middle gray



bandpass
filter

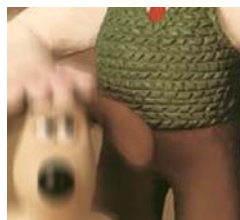


original



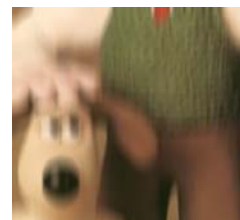
unsharp
masking

Motion Blur

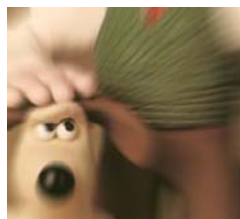


regional

vertical

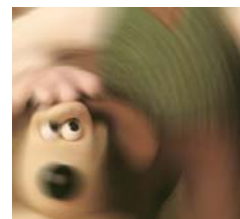


original



zoom

rotational



Noise Reduction



blurred image



color noise



color-only blur

Noise Reduction



blurred image



color noise



5x5 Wiener filter

Noise Reduction



periodic
noise



original



frequency
tuned filter

Shot Noise or Salt & Pepper Noise



+ shot noise



s&p noise



- shot noise

Nonlinear Filters: the Median



original



s&p noise



median filter

Nonlinear Filters: Min and Maxmin



+ shot noise



min filter



maxmin filter

Nonlinear Filters: Max and Minmax



- shot noise



max filter



minmax

Image Compression

Original image is
5244w x 4716h
@ 1200 ppi:
127MBytes



Yoyogi Park, Tokyo, October 1999. Photo by Alan Peters.

Image Compression: JPEG



Image Compression: JPEG

