# COL783: Digital Image Processing

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### **Image Enhancement vs Image Restoration**

Image enhancement: "improve" an image subjectively.

Image restoration: remove distortion from image in order

to go back to the "original" objective process

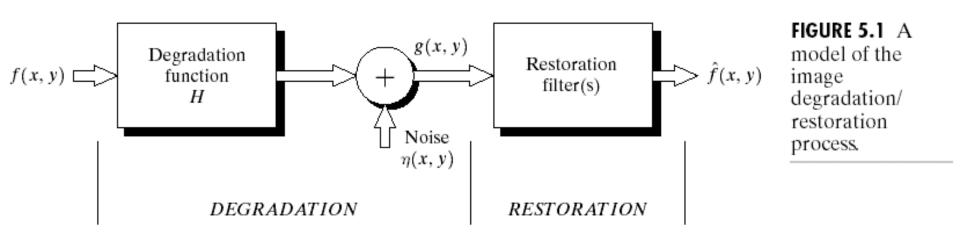


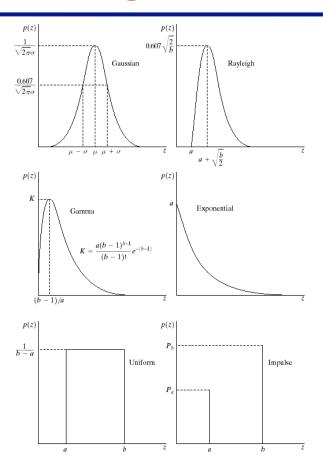
Original image



Blurred image

- Use a priori knowledge of the degradation
- Modeling the degradation and apply the inverse process
- Formulate and evaluate objective criteria of goodness





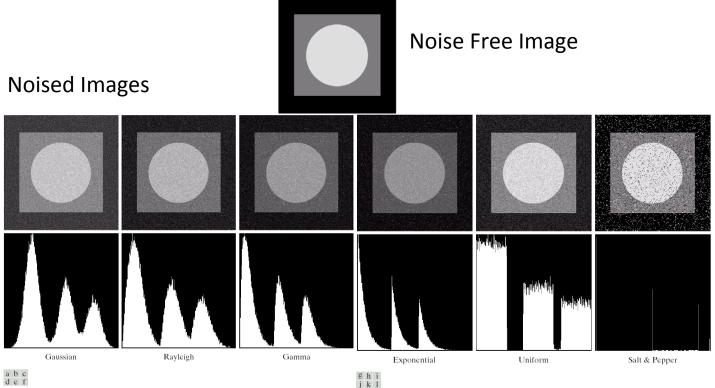


FIGURE 5.4 Images and histograms resulting from adding Gaussian, Rayleigh, and gamma noise to the image in Fig. 5.3.

FIGURE 5.4 (Continued) Images and histograms resulting from adding exponential, uniform, and impulse noise to the image in Fig. 5.3.

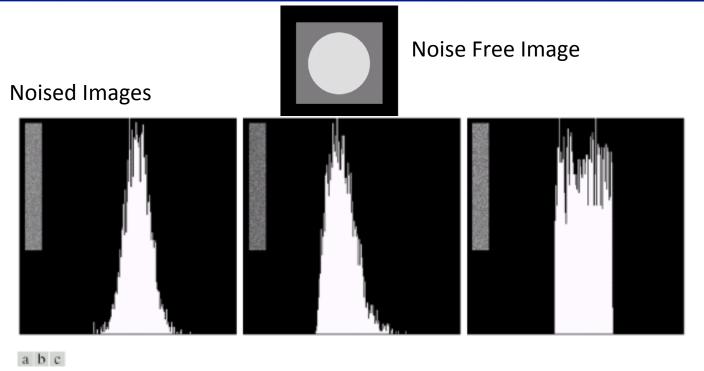


FIGURE 5.6 Histograms computed using small strips (shown as inserts) from (a) the Gaussian, (b) the Rayleigh, and (c) the uniform noisy images in Fig. 5.4.

### **Process:**

Observe and estimate noise type and parameters apply optimal (spatial) filtering (if known) observe result, adjust filter type/parameters ...

More like enhancement.

Filters: Mean, Median, Gaussian, ...



### FIGURE 5.5

(a) Image corrupted by sinusoidal noise. (b) Spectrum (each pair of conjugate impulses corresponds to one sine wave). (Original image courtesy of NASA.)

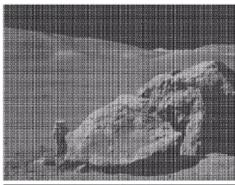
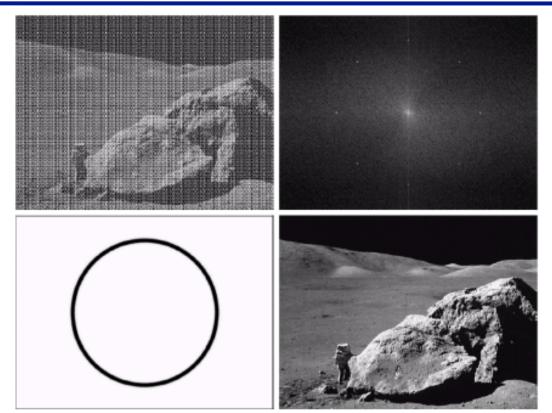






FIGURE 5.15 From left to right, perspective plots of ideal, Butterworth (of order 1), and Gaussian bandreject filters.



a b

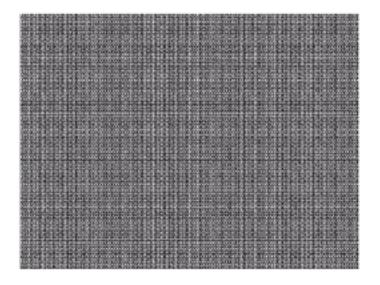
### FIGURE 5.16

- (a) Image corrupted by sinusoidal noise.
- (b) Spectrum of (a).
- (c) Butterworth bandreject filter (white represents 1). (d) Result of filtering. (Original image courtesy of NASA.)

(Source: Gonzalez and Woods)

### FIGURE 5.17 Noise pattern of the image in Fig. 5.16(a) obtained by

bandpass filtering.



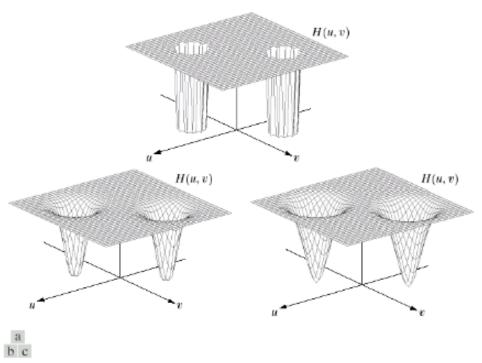
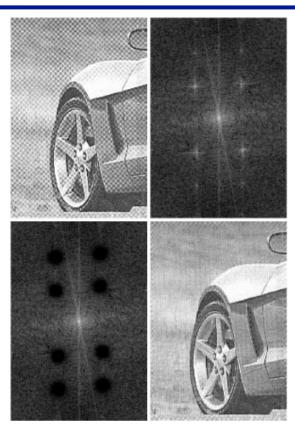


FIGURE 5.18 Perspective plots of (a) ideal, (b) Butterworth (of order 2), and (c) Gaussian notch (reject) filters.



a b

# FIGURE 4.64 (a) Sampled newspaper image showing a moiré pattern. (b) Spectrum. (c) Butterworth notch reject filter multiplied by the Fourier transform. (d) Filtered image.

(Source: Gonzalez and Woods)