

Unit 4

1

Image Restoration

Frequency Domain Filters (Part III)



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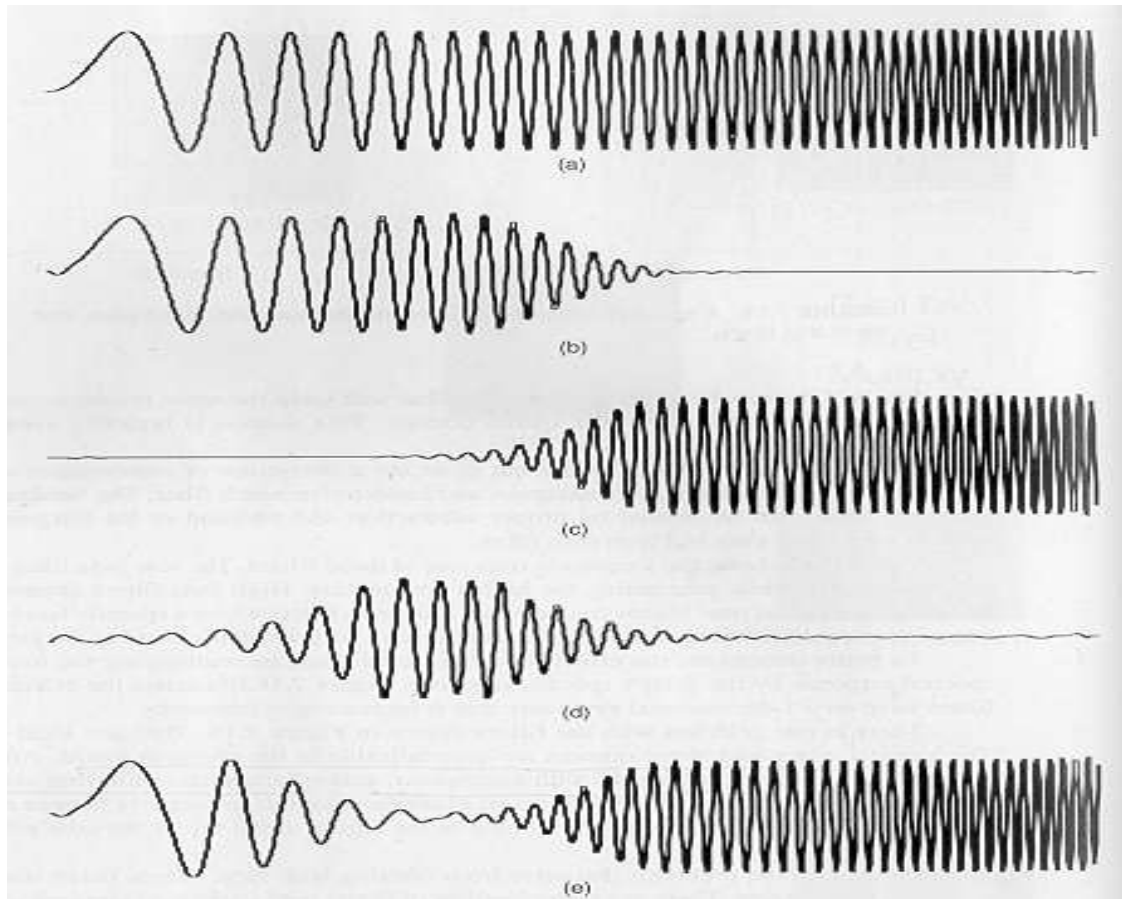
Filter

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- Filter: A device or material for suppression or minimizing waves or oscillations of certain frequencies
- Frequency: The number of times that a periodic function repeats the same sequence of values during a unit variation of the independent variable.
- Filters are classified as (Frequency Domain):
 - (1) Low-pass (2) High-pass
 - (3) Band-pass (4) Band-stopmany more

Filters Types

4



Original signal

Low-pass filtered

High-pass filtered

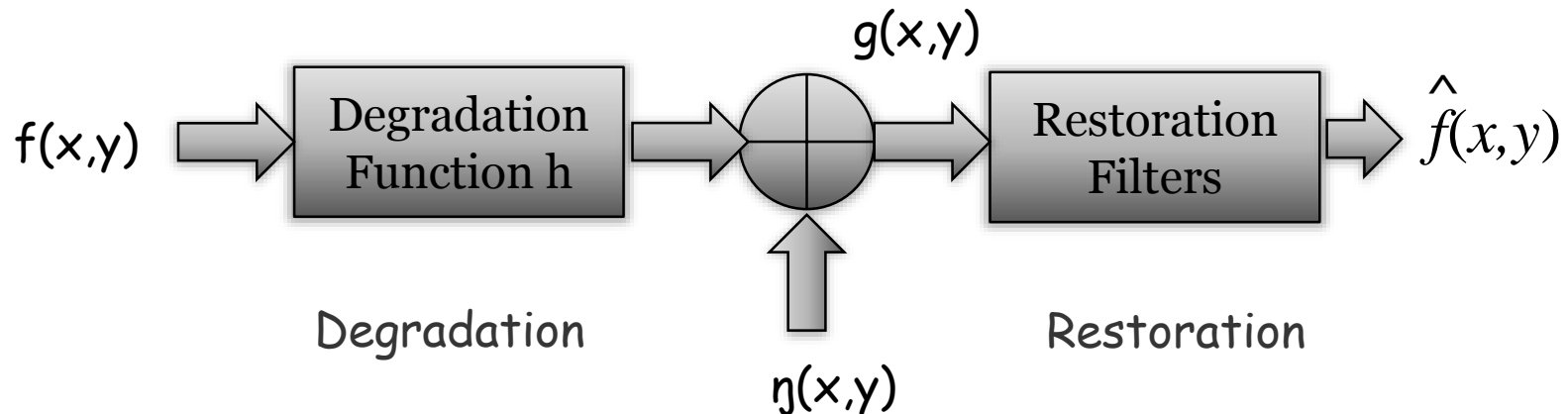
Band-pass filtered

Band-stop filtered

Image Restoration?

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- **Objective:** To restore a degraded/distorted image to its original content and quality.



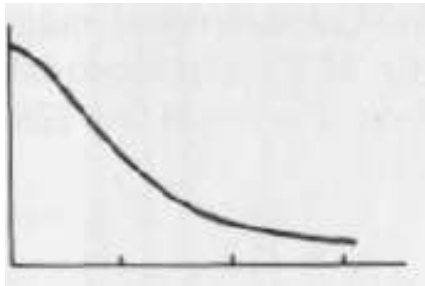
- **Spatial Domain:** $g(x,y)=h(x,y)*f(x,y)+ \eta(x,y)$
- **Frequency Domain:** $G(u,v)=H(u,v)F(u,v)+ \eta(u,v)$
- **Matrix:** $G=HF+\eta$

Low-Pass Filters (Smoothing filters)

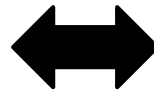
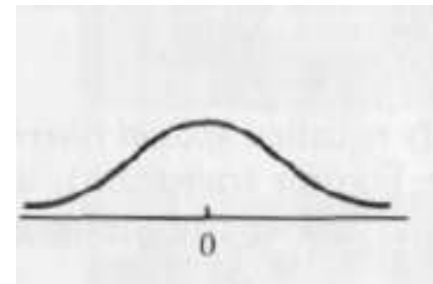
6

- Preserve Low Frequencies-Useful For Noise Suppression

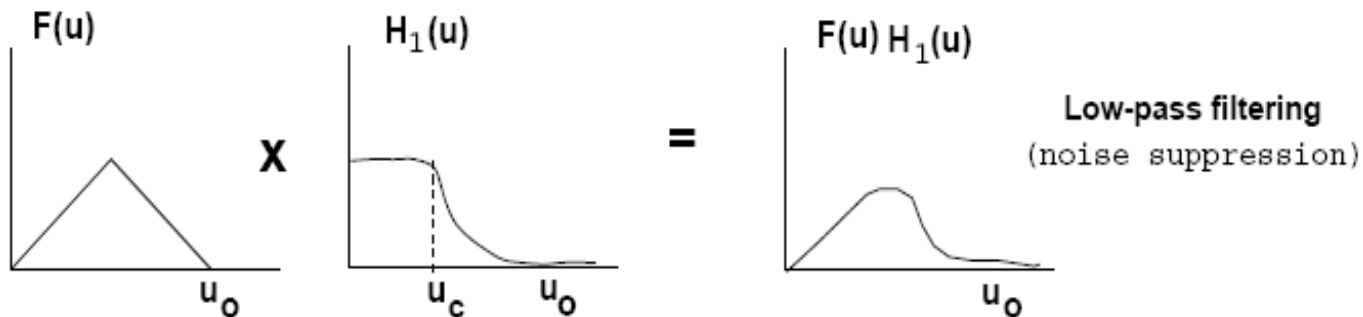
Frequency Domain



Time Domain



Example:

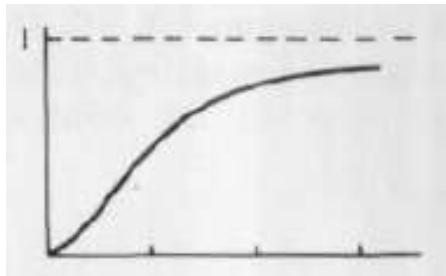


High-Pass Filters (Sharpening Filters)

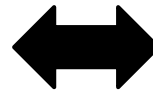
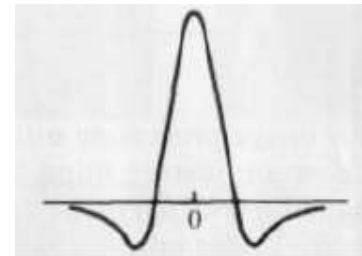
7

- Preserves High Frequencies - Useful for Edge Detection

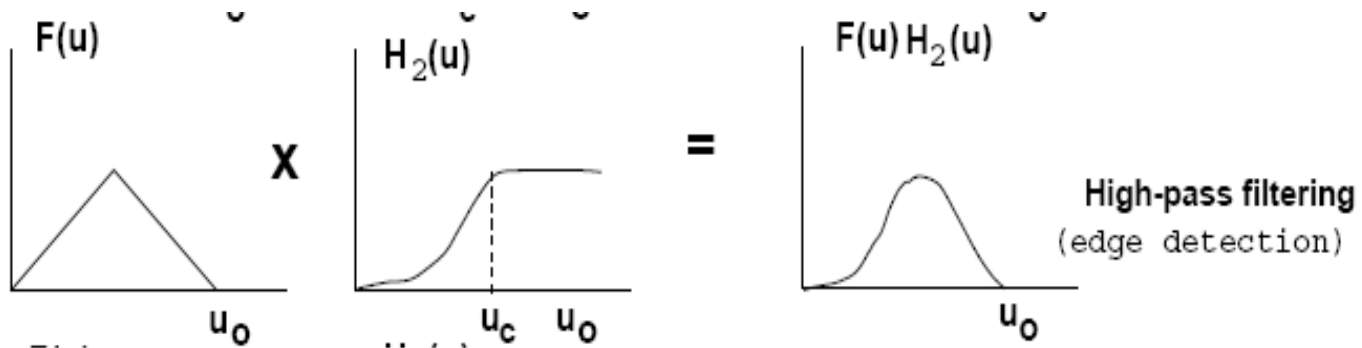
Frequency Domain



Time Domain



Example:

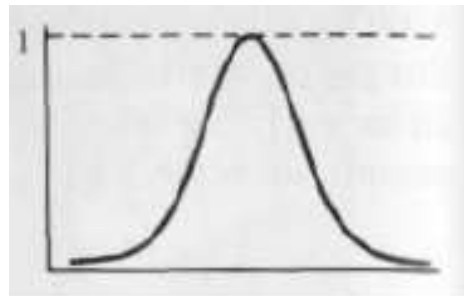


Band-Pass and Band Stop Filters

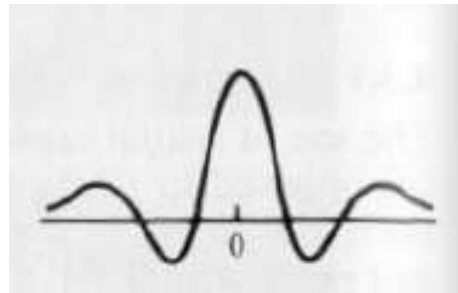
8

- Preserves Frequencies Within a Certain Band

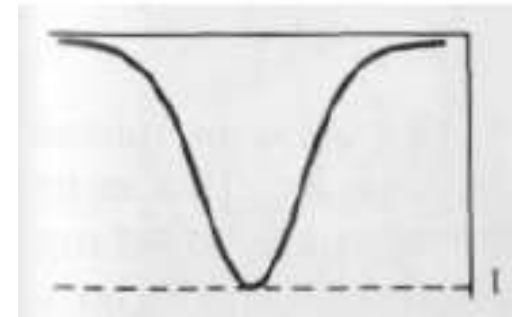
Frequency Domain



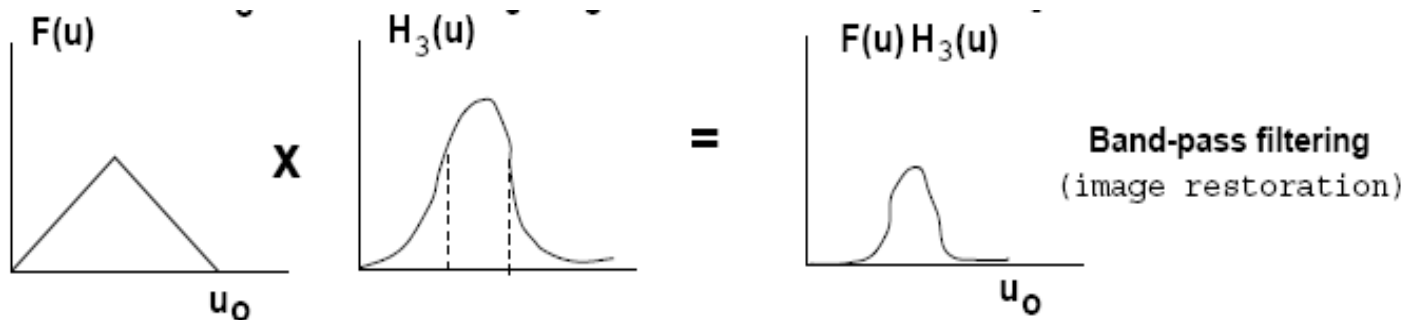
Time Domain



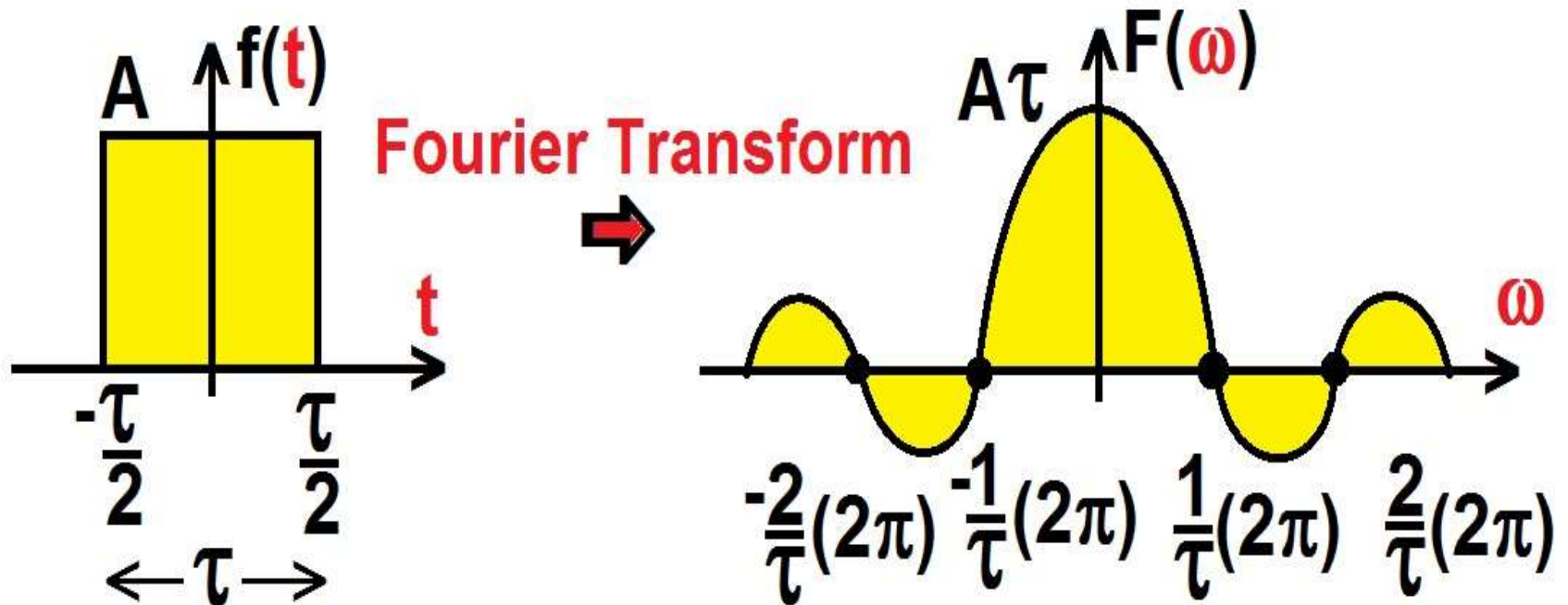
Band Stop/ Reject



Example:



What is a Fourier Transform? Mathematical Def.



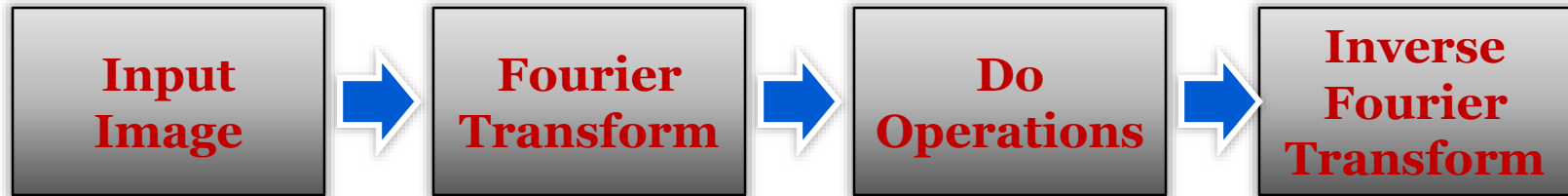
$$\mathcal{F}[f(t)] = \int_{-\infty}^{\infty} f(t) e^{-j\omega t} dt \quad j = \sqrt{-1}$$

$$f(t) = \mathcal{F}^{-1}[F(\omega)] = \int_{-\infty}^{\infty} F(\omega) e^{j\omega t} dt$$

Correction:
Before Integration
 $1/2\pi$

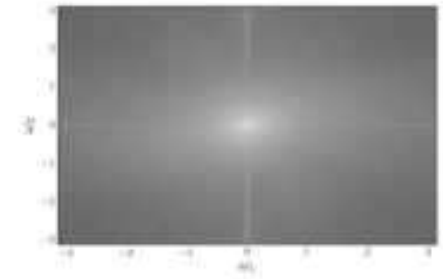
Image Processing and Fourier Transform

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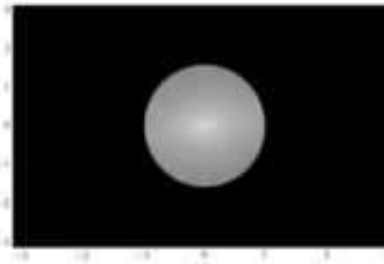
Fourier Transform:

$$F(u,v) = \frac{1}{MN} \sum_{x=0}^{M-1} \sum_{y=0}^{N-1} f(x,y) e^{-j 2 \pi (u x / M + v y / N)}$$



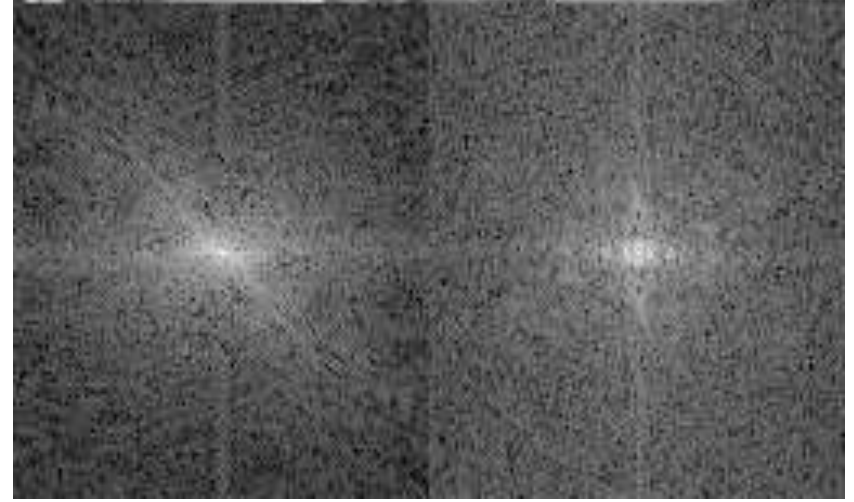
Inverse Fourier Transform

$$f(x,y) = \sum_{u=0}^{M-1} \sum_{v=0}^{N-1} F(u,v) e^{j 2 \pi (u x / M + v y / N)}$$



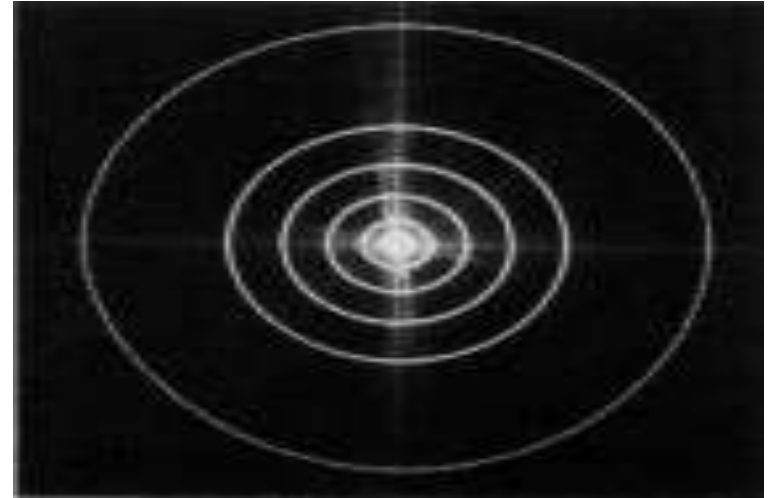
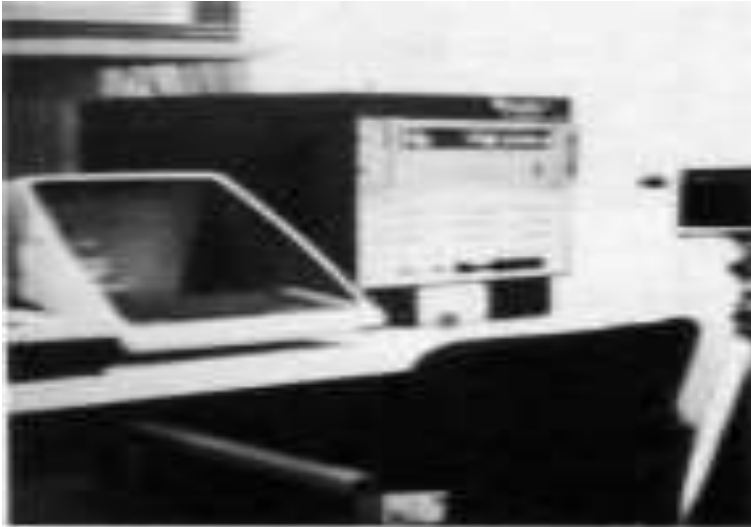
Fourier Transform

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Fourier Spectrum

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✓ Percentage of image power enclosed in circles (Small to Large): 90, 95, 98, 99, 99.5, 99.9

Fourier Transform

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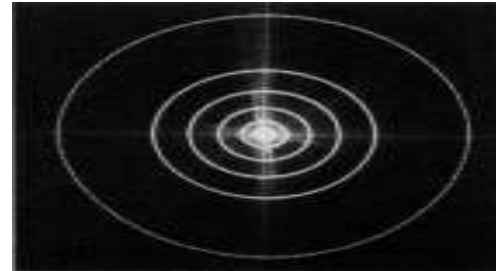
$$g(x,y) = f(x,y) * h(x,y)$$

$$G(u,v) = F(u,v) \cdot H(u,v)$$

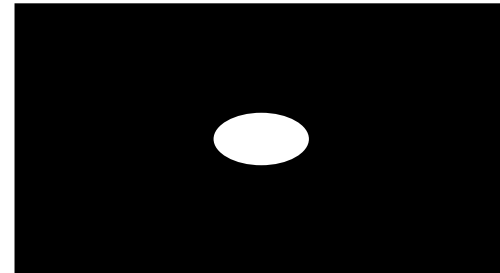
$f(x,y)$



$F(u,v)$



$g(x,y)$



$H(u,v)$

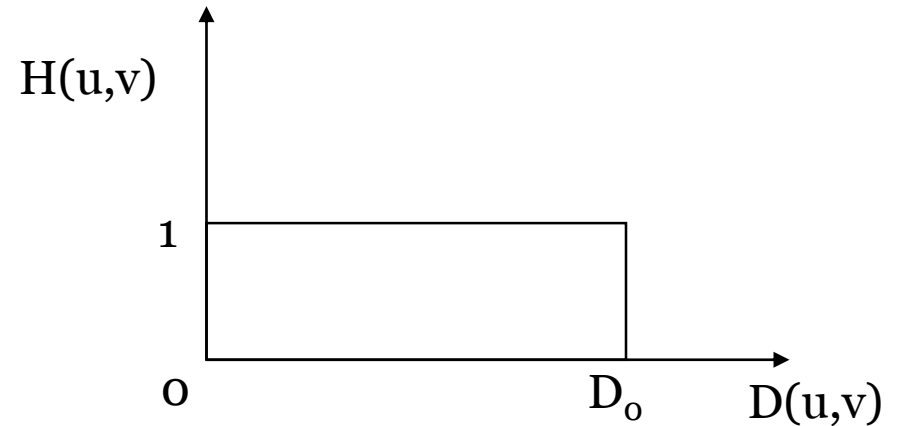
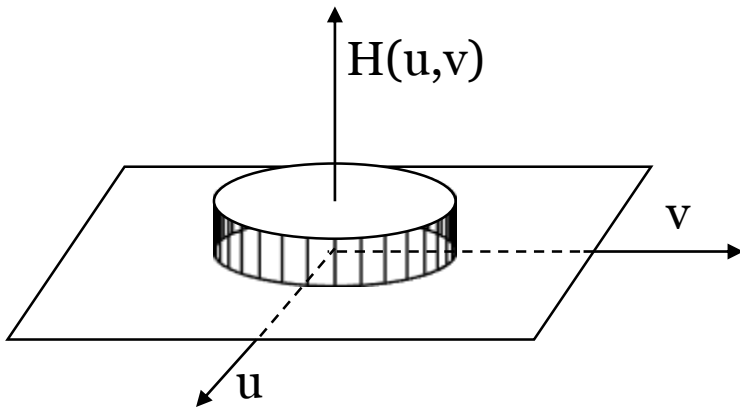
Ideal Low Pass Filters

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$$H(u,v) = \begin{cases} 1 & D(u,v) \leq D_o \\ 0 & D(u,v) > D_o \end{cases}$$

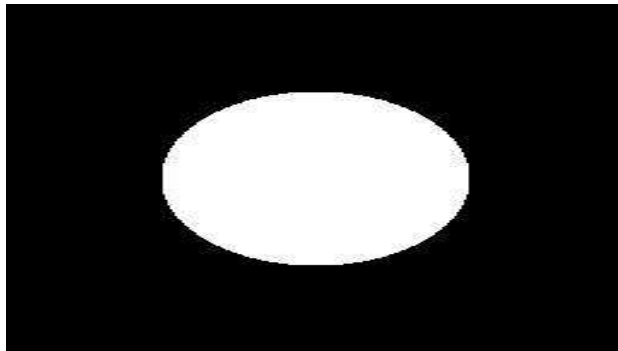
$$D(u,v) = \sqrt{u^2 + v^2}$$

D_o = cut off frequency

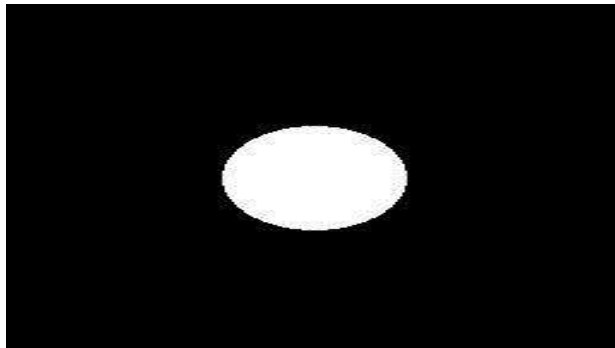


Blurring-Ideal Low Pass Filter

99.7%



99.37%



98.65%

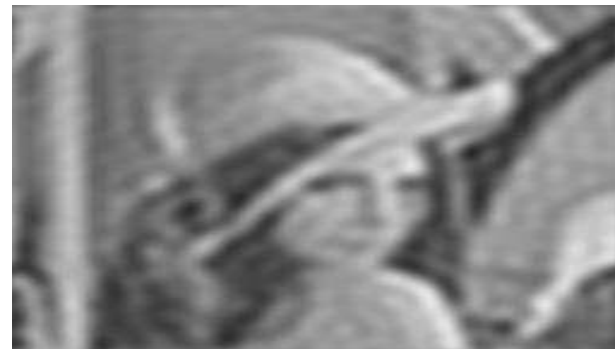
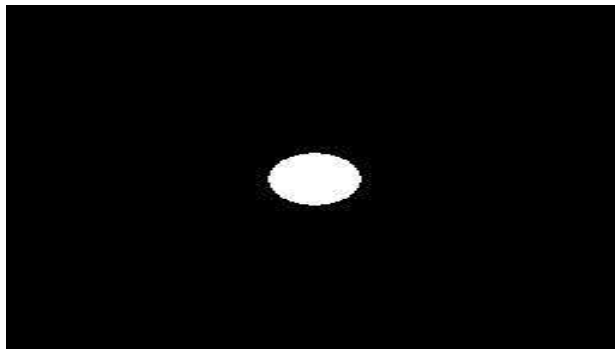


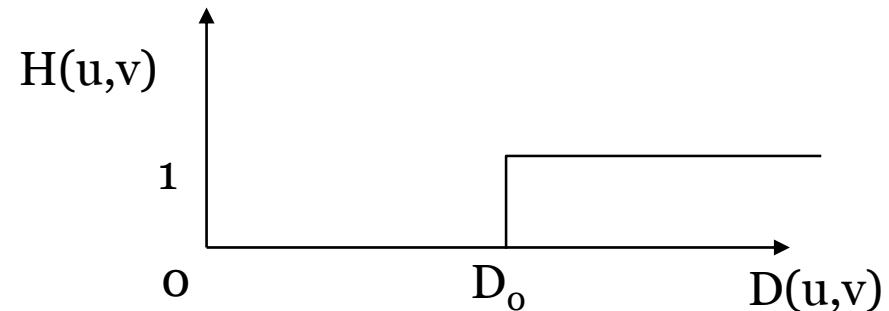
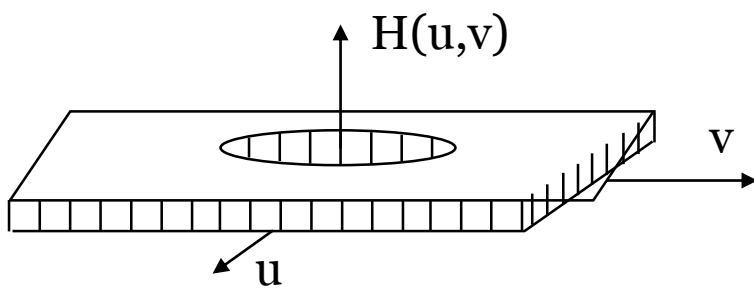
Image Sharpening - High Pass Filter

$H(u,v)$ - Ideal Filter

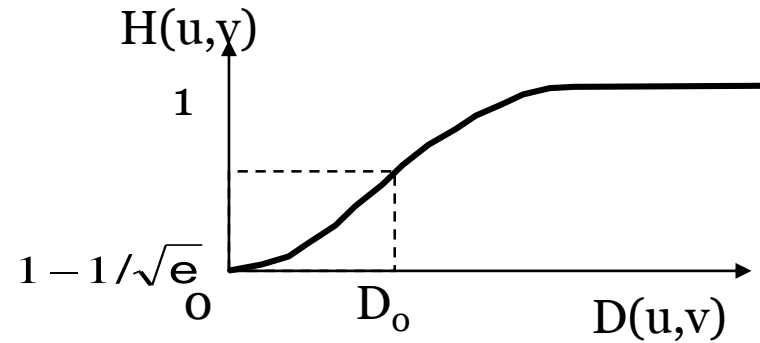
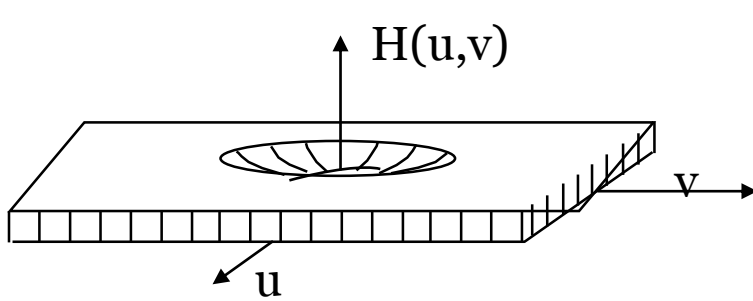
$$H(u,v) = \begin{cases} 0 & D(u,v) \leq D_o \\ 1 & D(u,v) > D_o \end{cases}$$

$$D(u,v) = \sqrt{u^2 + v^2}$$

D_o = cut off frequency

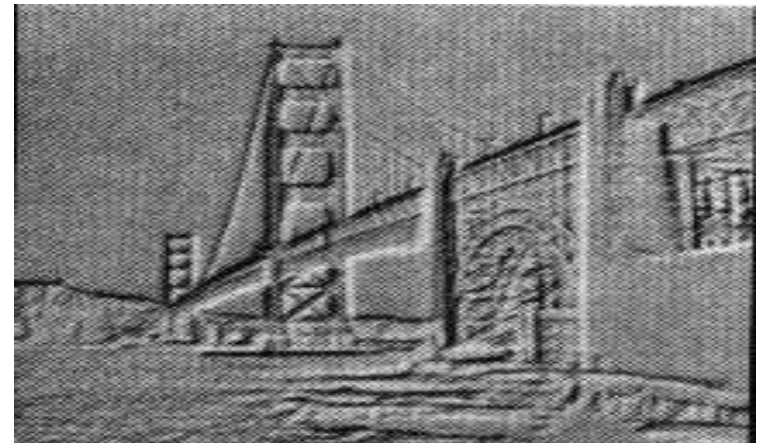


High Pass Gaussian Filter



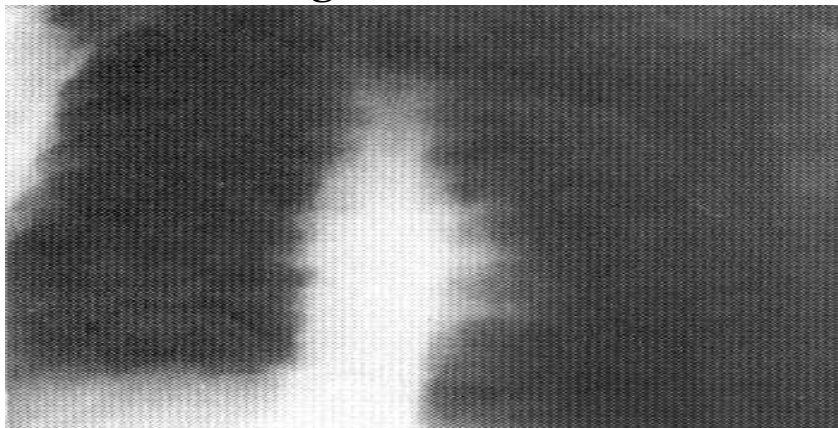
$$H(u,v) = 1 - e^{-D^2(u,v)/(2D_0^2)}$$

$$D(u,v) = \sqrt{u^2 + v^2}$$

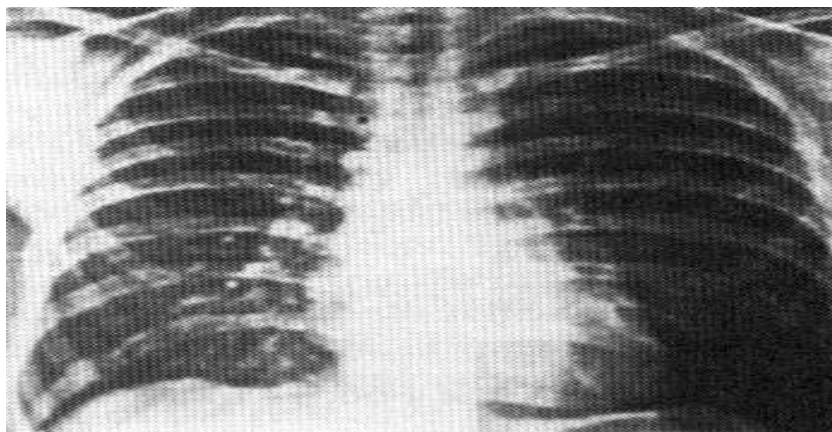
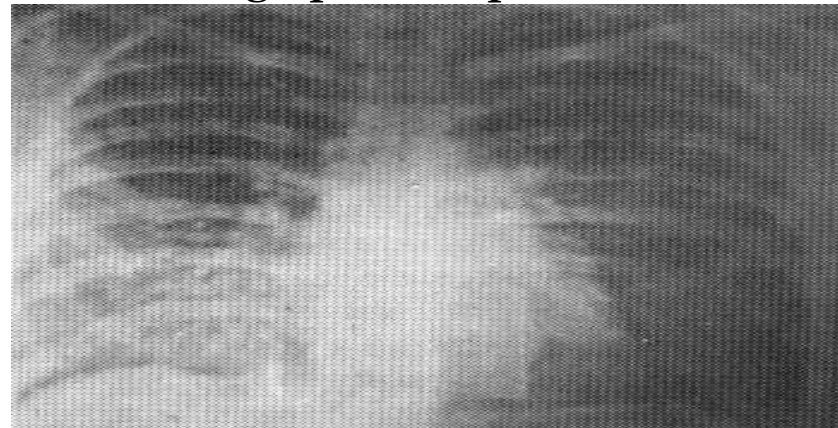


High Pass Filtering - Example

Original



High pass Emphasis



High Frequency Emphasis + Histogram Equalization

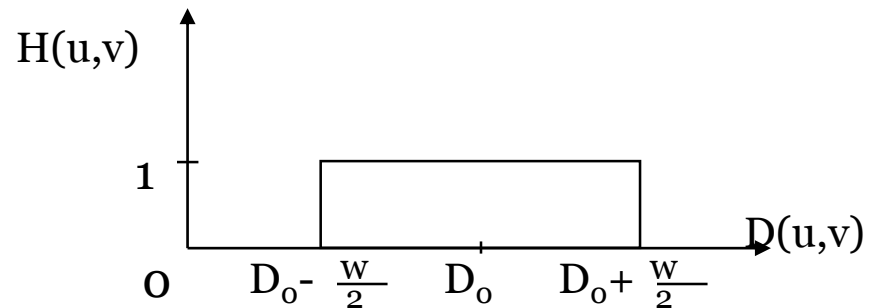
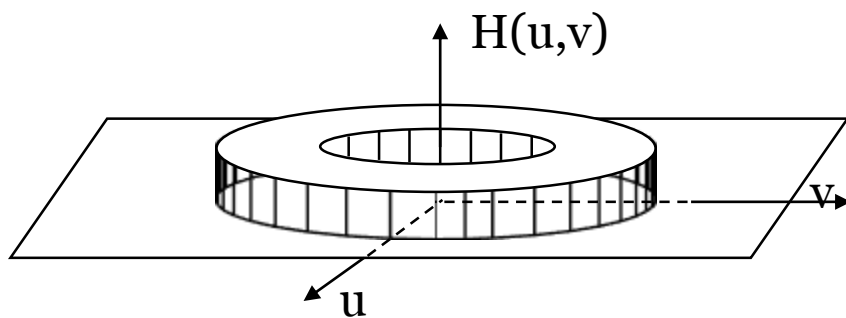
Band Pass Filtering

$$H(u,v) = \begin{cases} 0 & D(u,v) \leq D_0 - \frac{w}{2} \\ 1 & D_0 - \frac{w}{2} \leq D(u,v) \leq D_0 + \frac{w}{2} \\ 0 & D(u,v) > D_0 + \frac{w}{2} \end{cases}$$

$$D(u,v) = \sqrt{u^2 + v^2}$$

D_0 = cut off frequency

w = band width



Band Reject Filters

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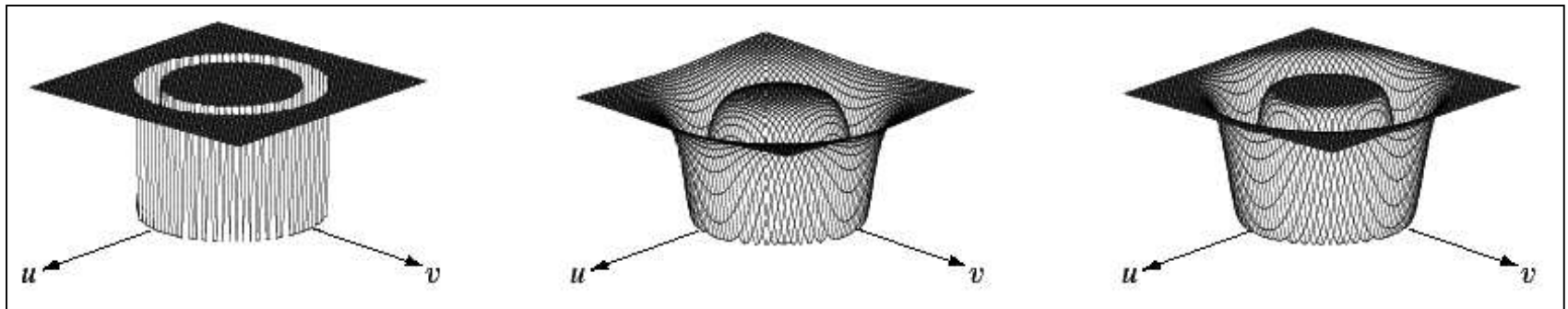
- Removing periodic noise from an image involves removing a particular range of frequencies from that image.
- **Band reject filters** can be used for this purpose.
- An ideal band reject filter is given as follows:

$$H(u, v) = \begin{cases} 1 & \text{if } D(u, v) < D_0 - \frac{W}{2} \\ 0 & \text{if } D_0 - \frac{W}{2} \leq D(u, v) \leq D_0 + \frac{W}{2} \\ 1 & \text{if } D(u, v) > D_0 + \frac{W}{2} \end{cases}$$

Band Reject Filters contd..

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- The ideal band reject filter is shown below, along with Butterworth and Gaussian versions of the filter.



Ideal Band
Reject Filter

Butterworth
Band Reject
Filter (of order 1)

Gaussian
Band Reject
Filter

Result of Band Reject Filter

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Fig: Corrupted by Sinusoidal Noise



Fig: Fourier spectrum of Corrupted Image

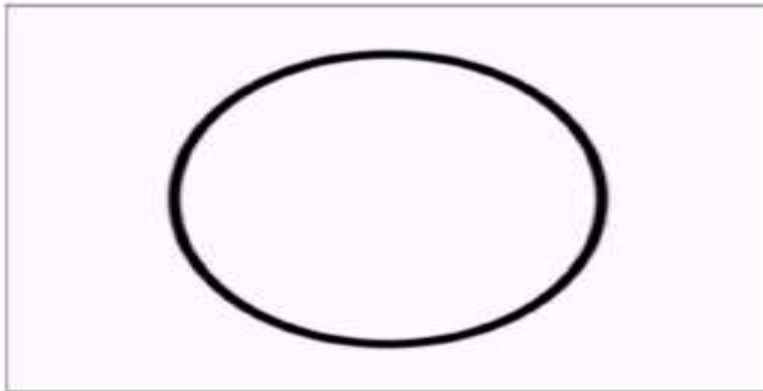


Fig: Butterworth Band Reject Filter



Fig :Filtered image

Adaptive Filters

- Adaptive, local noise reduction filter
 - If σ_{η}^2 is zero, return simply the value of $g(x, y)$
 - If $\sigma_{\eta}^2 < \sigma_L^2$, return a value close to $g(x, y)$
 - If $\sigma_{\eta}^2 = \sigma_L^2$, return the arithmetic mean value m_L

$$\hat{f}(x, y) = g(x, y) - \frac{\sigma_{\eta}^2}{\sigma_L^2} [g(x, y) - m_L]$$

where σ_L^2 - Local variance of the local region

m_L - Local Mean

σ_{η}^2 - Variance of overall noise

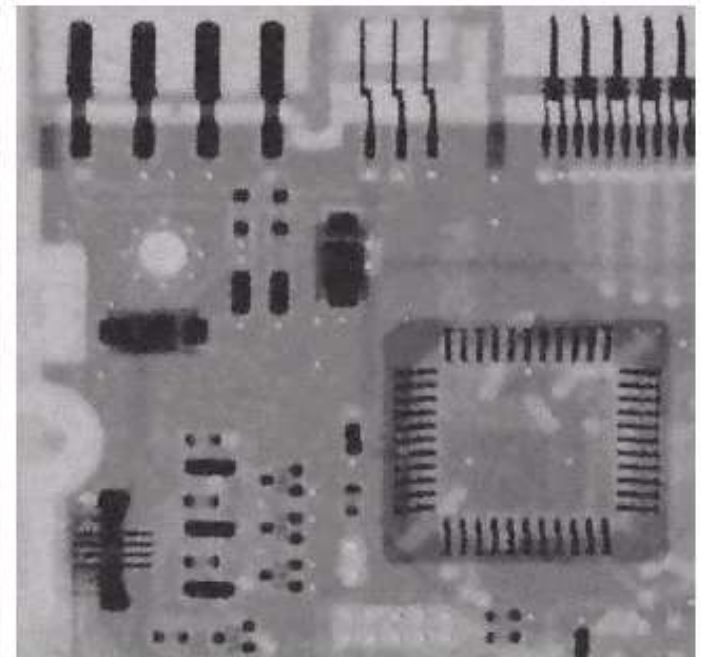
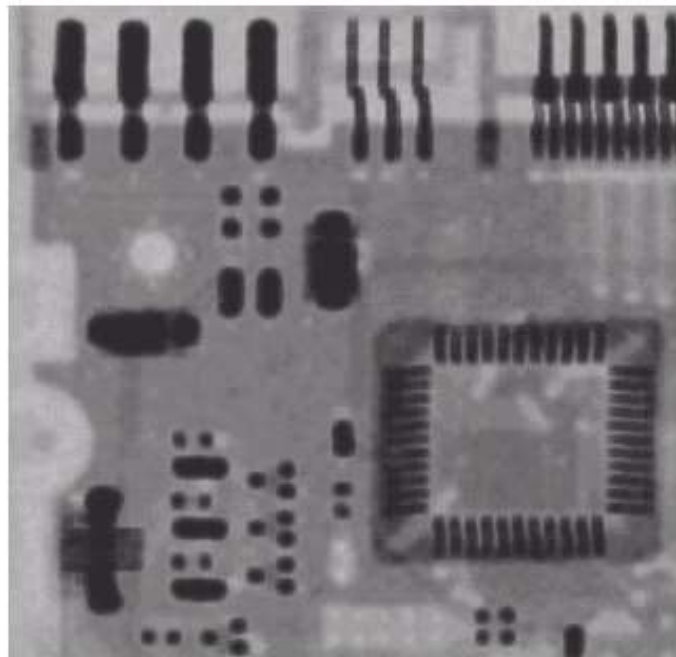
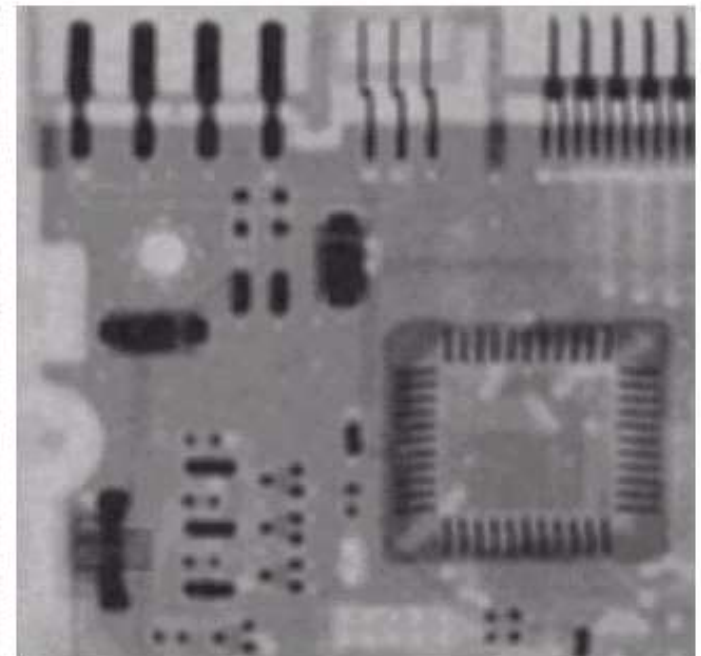
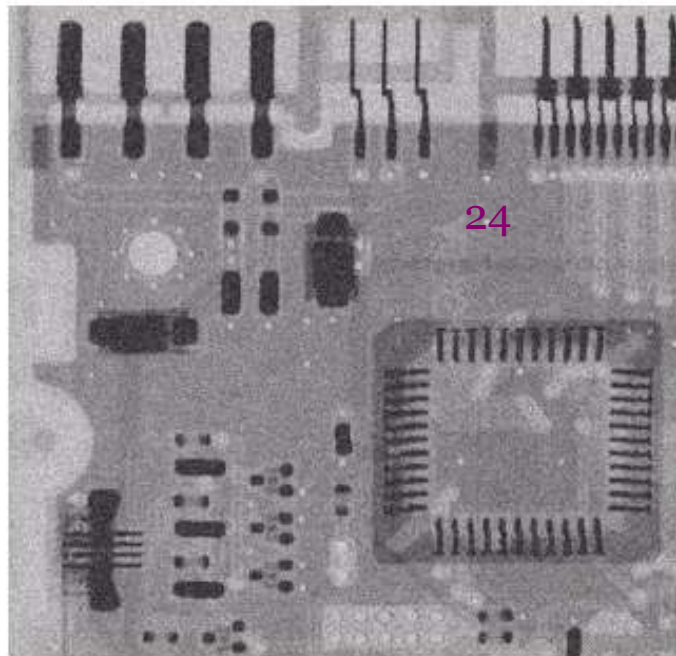
$g(x, y)$ - Pixel value at the position (x,y)

$$\begin{bmatrix} 1 & 0 & 2 & 0 \\ 0 & 3 & 0 & 4 \\ 0 & 0 & 5 & 0 \\ 6 & 0 & 0 & 7 \end{bmatrix}$$

a	b
c	d

FIGURE 5.13

(a) Image corrupted by additive Gaussian noise of zero mean and variance 1000.
 (b) Result of arithmetic mean filtering.
 (c) Result of geometric mean filtering.
 (d) Result of adaptive noise reduction filtering. All filters were of size 7×7 .



Adaptive Median Filter

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○ Adaptive median filter

- Z_{\min} = minimum gray level value in S_{xy}
- Z_{\max} = maximum gray level value in S_{xy}
- Z_{med} = median of gray levels in S_{xy}
- Z_{xy} = gray level at coordinates (x, y)
- S_{\max} = maximum allowed size of S_{xy}

Algorithm

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Algorithm:

Level A: $A1 = Z_{med} - Z_{min}$

$A2 = Z_{med} - Z_{max}$

If $A1 > 0$ AND $A2 < 0$, Go to
level B

Else increase the window size

If window size $\leq S_{max}$
repeat level A

Else output Z_{med}

Level B: $B1 = Z_{xy} - Z_{min}$

$B2 = Z_{xy} - Z_{max}$

If $B1 > 0$ AND $B2 < 0$, output Z_{xy}

Else output Z_{med}

Objectives:

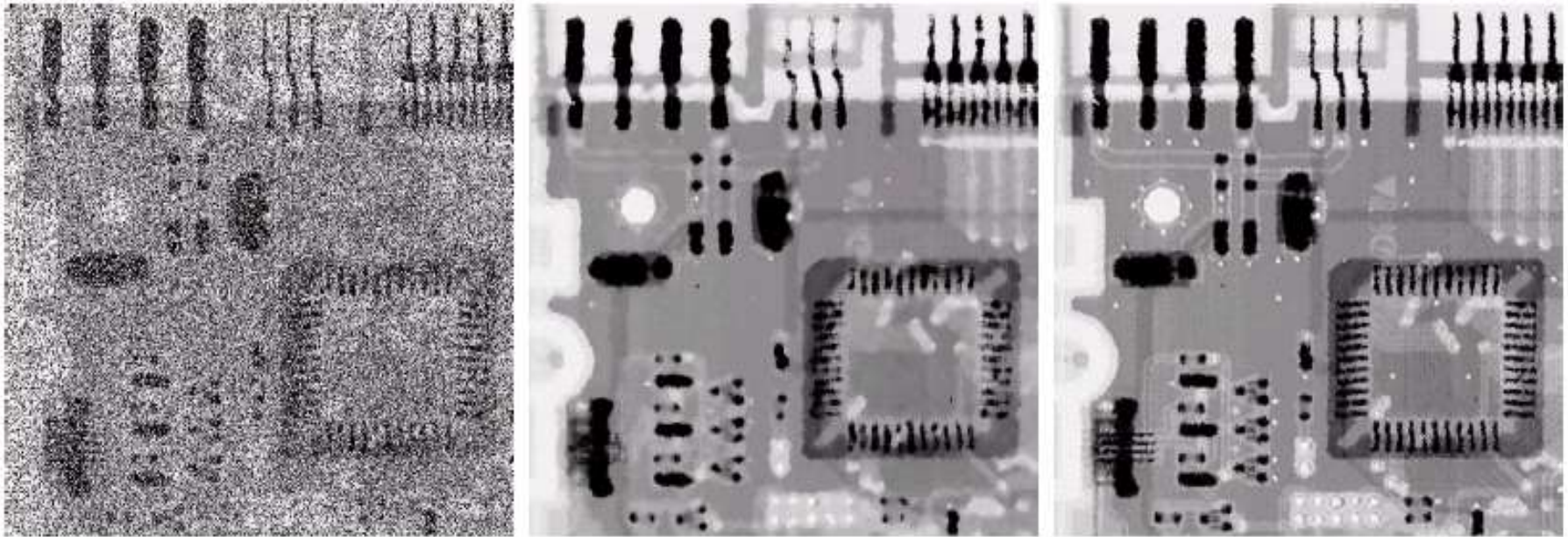
✓ Remove salt and
pepper (Impulse)
noise

✓ Provide smoothing

✓ Reduce distortion,
such as excessive
thinning or
thickening of object
boundaries

Results

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a b c

FIGURE 5.14 (a) Image corrupted by salt-and-pepper noise with probabilities $P_a = P_b = 0.25$. (b) Result of filtering with a 7×7 median filter. (c) Result of adaptive median filtering with $S_{\max} = 7$.

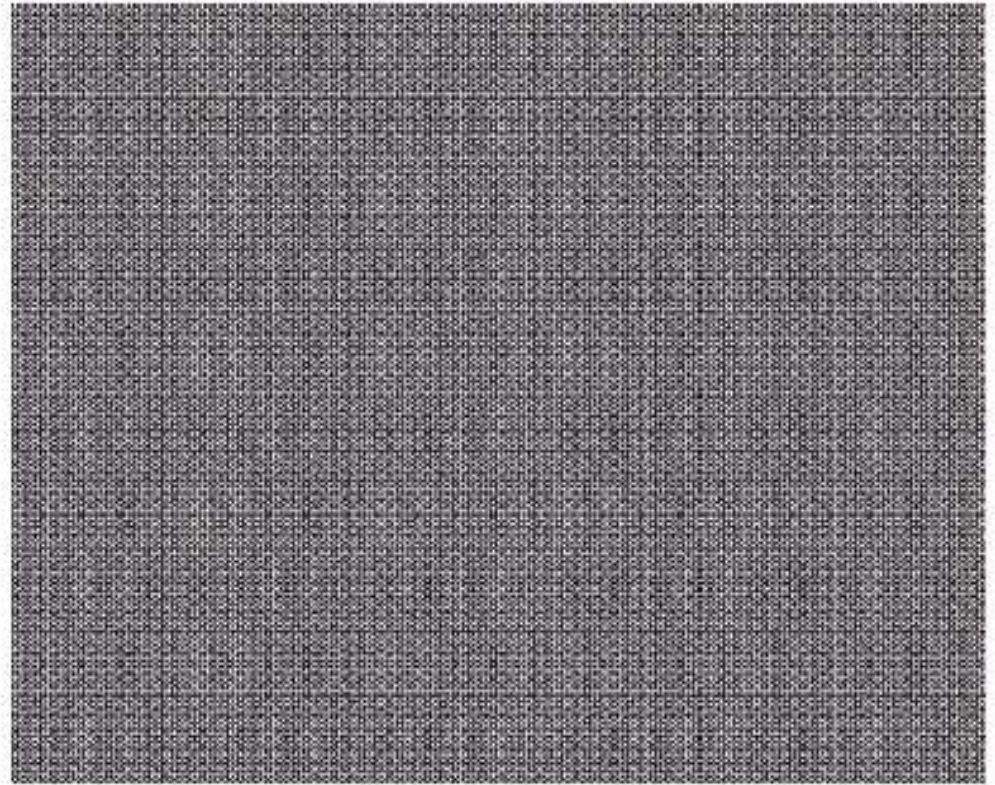
Band Pass Filters

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$$H_{bp}(u, v) = 1 - H_{br}(u, v)$$

FIGURE 5.17

Noise pattern of
the image in
Fig. 5.16(a)
obtained by
bandpass filtering.



Notch Filter

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- ❑ Are used to remove repetitive "Spectral" noise from an image.
- ❑ Are like a narrow High pass filter, but they "notch" out frequencies other than the dc component.
- ❑ Attenuate a selected frequency (and some of its neighbors) and leave other frequencies of the Fourier transform relatively unchanged.

Notch Filters

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- Notch filters
 - **Ideal Notch Reject Filter**

$$H(u, v) = \begin{cases} 0 & \text{if } D_1(u, v) \leq D_0 \text{ or } D_2(u, v) \leq D_0 \\ 1 & \text{otherwise} \end{cases}$$

$$D_1(u, v) = \left[(u - M/2 - u_0)^2 + (v - N/2 - v_0)^2 \right]^{1/2}$$

$$D_2(u, v) = \left[(u - M/2 + u_0)^2 + (v - N/2 + v_0)^2 \right]^{1/2}$$

Notch Filters

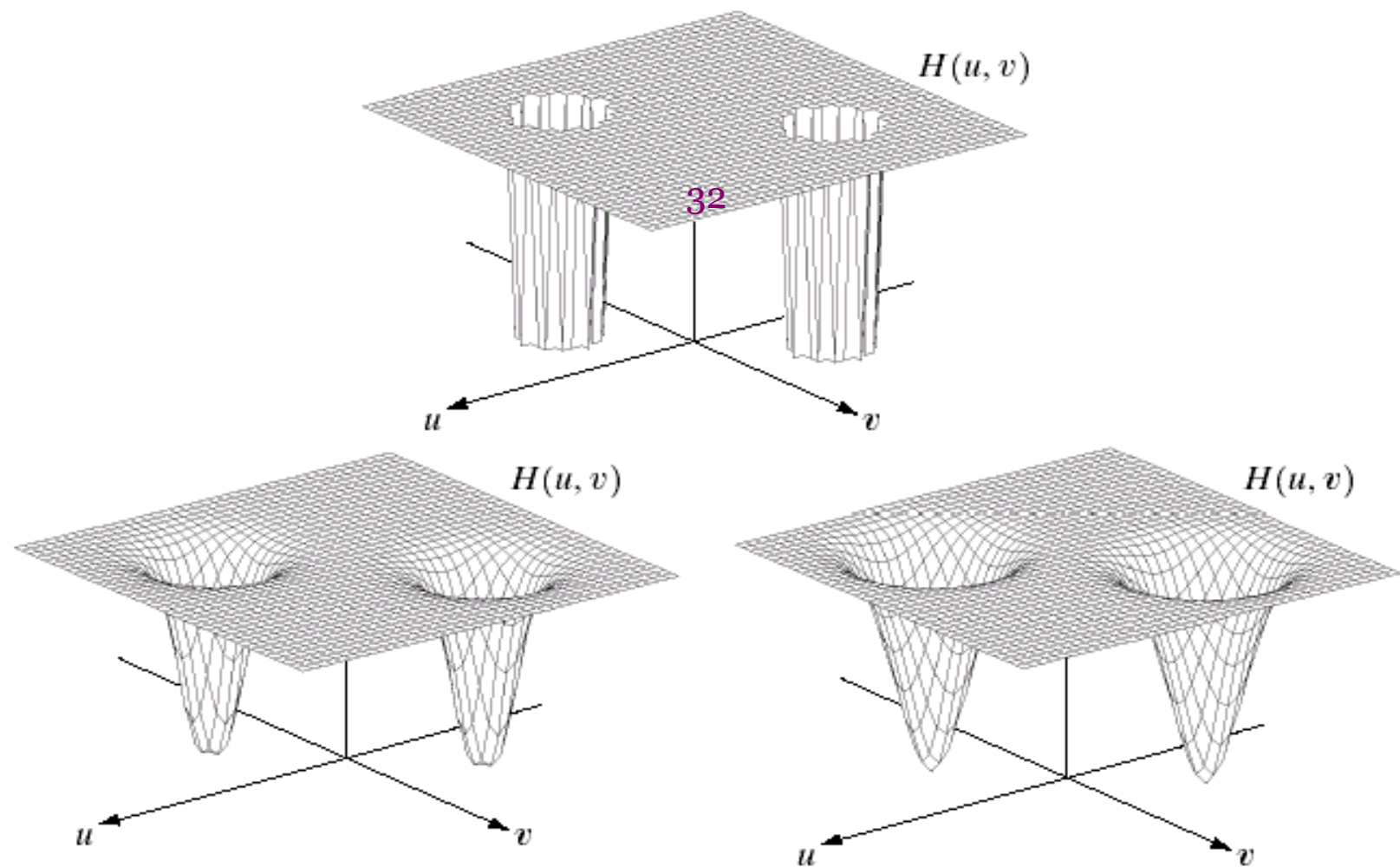
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- Butterworth Notch Reject Filter of order n

$$H(u, v) = \frac{1}{1 + \left[\frac{D_0^2}{D_1(u, v)D_2(u, v)} \right]^n}$$

- Gaussian notch reject filter

$$H(u, v) = 1 - e^{-\frac{1}{2} \left[\frac{D_1(u, v)D_2(u, v)}{D_0^2} \right]}$$

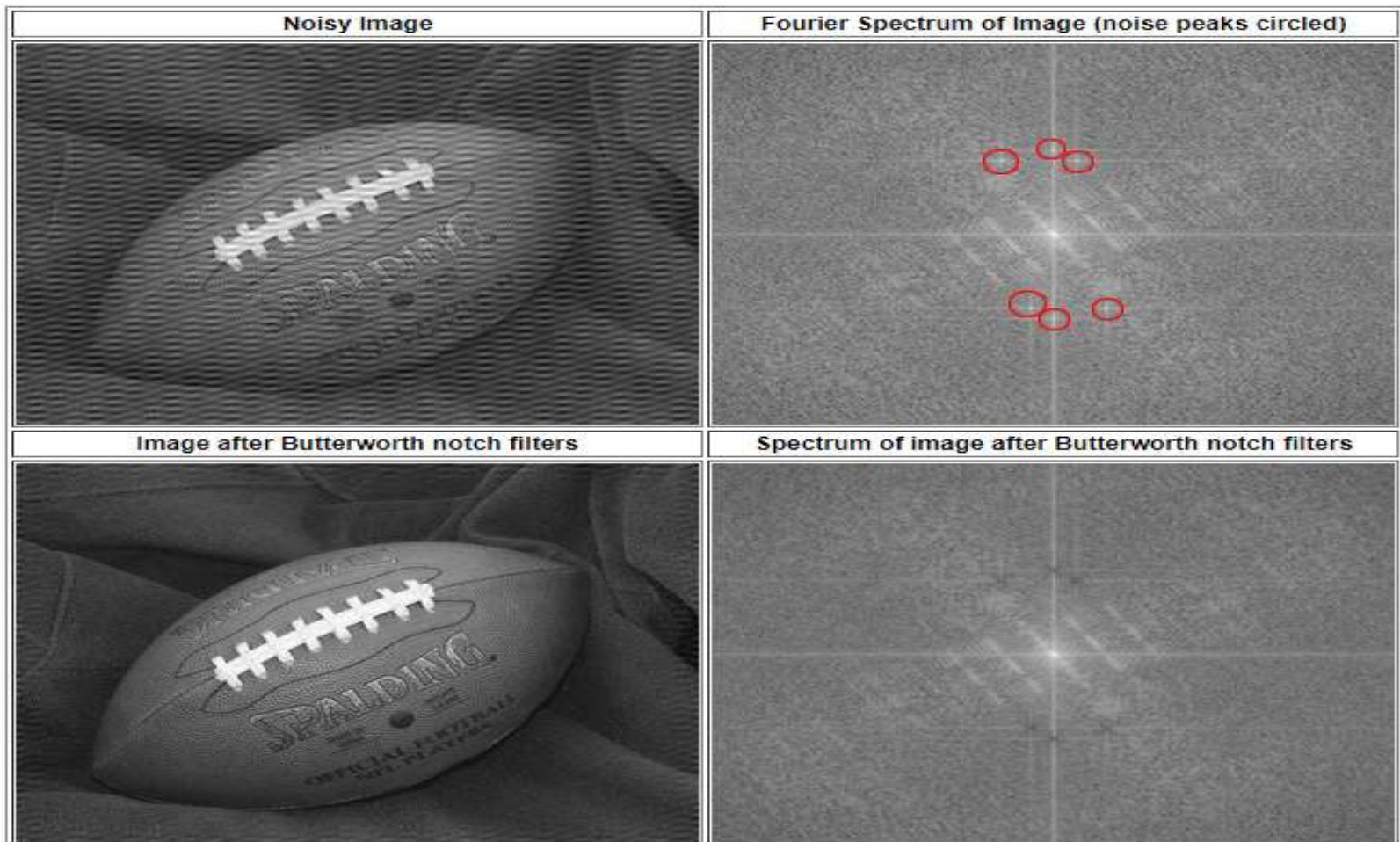


a
b c

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

Notch Filter Result

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**I never learn anything
talking. I only learn things
when I ask questions.**

Lou Holtz

Thank You!
Any Question Please?

kalyan5.blogspot.in