



SNS COLLEGE OF TECHNOLOGY

(AN AUTONOMOUS INSTITUTION)

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Department of Biomedical Engineering

Course Name: 19BMB304 & Biomedical Image Processing

III Year : VI Semester

**Unit III : IMAGE RESTORATION AND
SEGMENTATION**

Topic : Noise models



Order Statistics Filters



Spatial filters that are based on ordering the pixel values that make up the neighbourhood operated on by the filter

Useful spatial filters include

- Median filter
- Max and min filter
- Midpoint filter
- Alpha trimmed mean filter



Median Filter



Median Filter:

$$\hat{f}(x, y) = \underset{(s,t) \in S_{xy}}{\text{median}}\{g(s, t)\}$$

Excellent at noise removal, without the smoothing effects that can occur with other smoothing filters

Particularly good when salt and pepper noise is present



Noise Corruption Example

Original Image

54	52	57	55	56	52	51
50	49	51	50	52	53	58
51	204	52	52	0	57	60
48	50	51	49	53	59	63
49	51	52	55	58	64	67
50	54	57	60	63	67	70
51	55	59	62	65	69	72

Image $f(x, y)$

Filtered Image

Image $f(x, y)$



Max and Min Filter



Max Filter:

$$\hat{f}(x, y) = \max_{(s,t) \in S_{xy}} \{g(s, t)\}$$

Min Filter:

$$\hat{f}(x, y) = \min_{(s,t) \in S_{xy}} \{g(s, t)\}$$

Max filter is good for pepper noise and min is good for salt noise



Noise Corruption Example

Original Image

54	52	57	55	56	52	51
50	49	51	50	52	53	58
51	204	52	52	0	57	60
48	50	51	49	53	59	63
49	51	52	55	58	64	67
50	54	57	60	63	67	70
51	55	59	62	65	69	72

Image $f(x, y)$

Filtered Image

Image $f(x, y)$



Midpoint Filter



Midpoint Filter:

$$\hat{f}(x, y) = \frac{1}{2} \left[\max_{(s,t) \in S_{xy}} \{g(s, t)\} + \min_{(s,t) \in S_{xy}} \{g(s, t)\} \right]$$

Good for random Gaussian and uniform noise



Noise Corruption Example



Original Image

54	52	57	55	56	52	51
50	49	51	50	52	53	58
51	204	52	52	0	57	60
48	50	51	49	53	59	63
49	51	52	55	58	64	67
50	54	57	60	63	67	70
51	55	59	62	65	69	72

Image $f(x, y)$

Filtered Image

Image $f(x, y)$



Alpha-Trimmed Mean Filter



Alpha-Trimmed Mean Filter:

$$\hat{f}(x, y) = \frac{1}{mn - d} \sum_{(s,t) \in S_{xy}} g_r(s, t)$$

We can delete the $d/2$ lowest and $d/2$ highest grey levels

So $g_r(s, t)$ represents the remaining $mn - d$ pixels



Noise Corruption Example

Original Image

54	52	57	55	56	52	51
50	49	51	50	52	53	58
51	204	52	52	0	57	60
48	50	51	49	53	59	63
49	51	52	55	58	64	67
50	54	57	60	63	67	70
51	55	59	62	65	69	72

Image $f(x, y)$

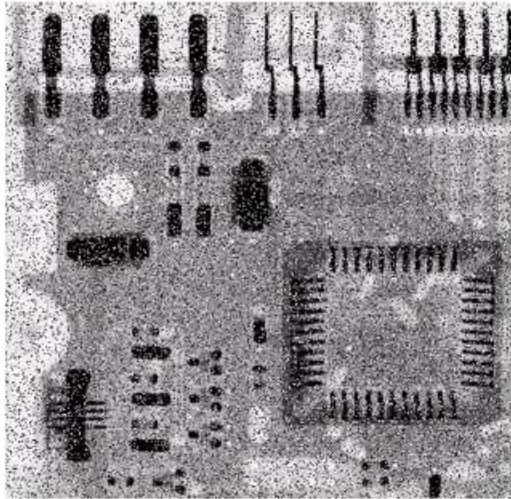
Filtered Image

Image $f(x, y)$

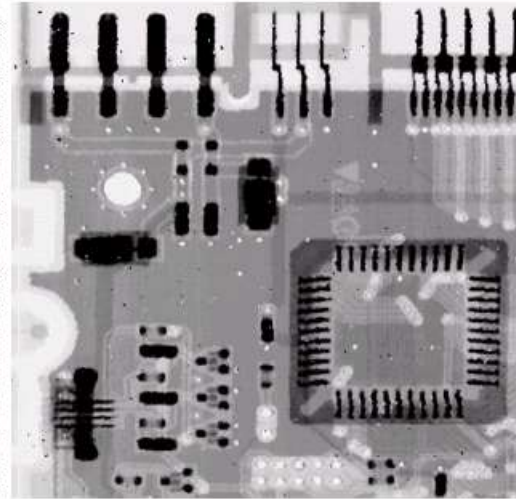


Noise Removal Examples

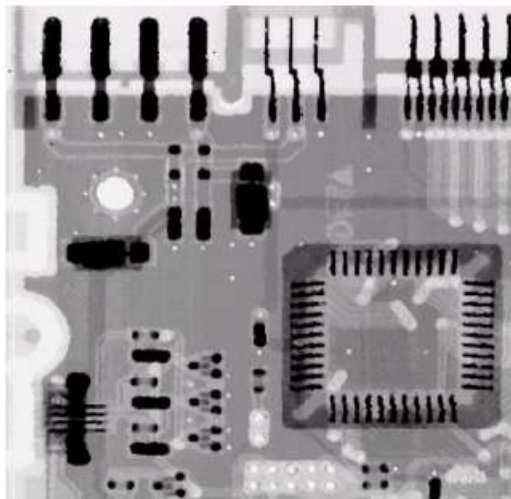
Image
Corrupted
By Salt And
Pepper Noise



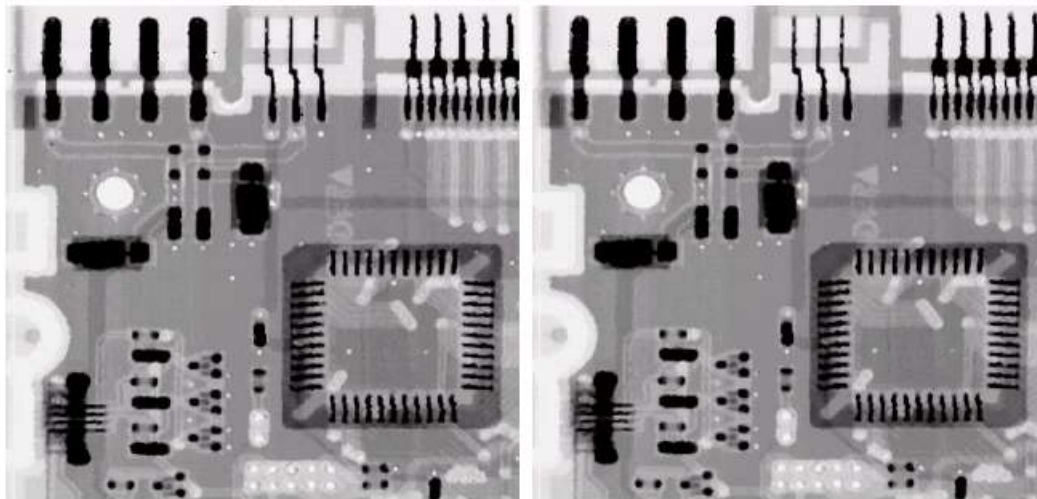
Result of
Pass With A
3*3 Median
Filter



Result of 2
Passes With
A 3*3 Median
Filter



Result of 3
Passes With
A 3*3 Median
Filter





Noise Removal Examples (cont...)

Image
Corrupted
By Pepper
Noise

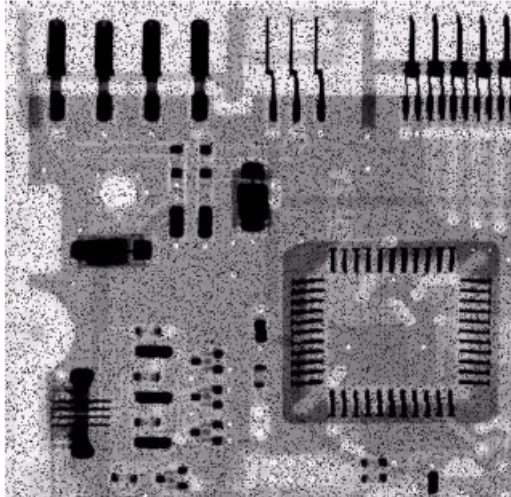
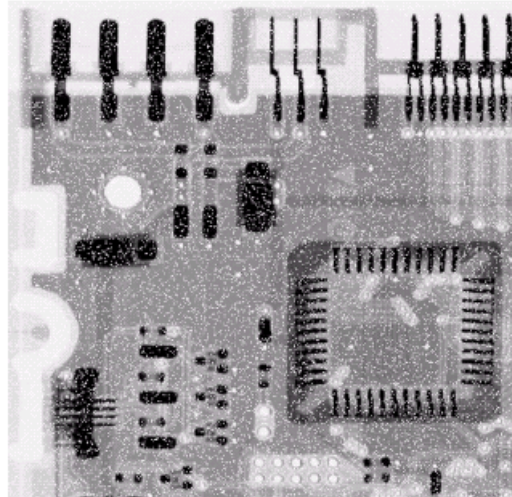
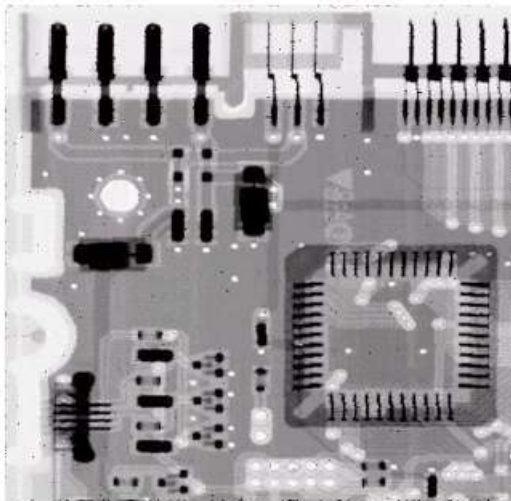


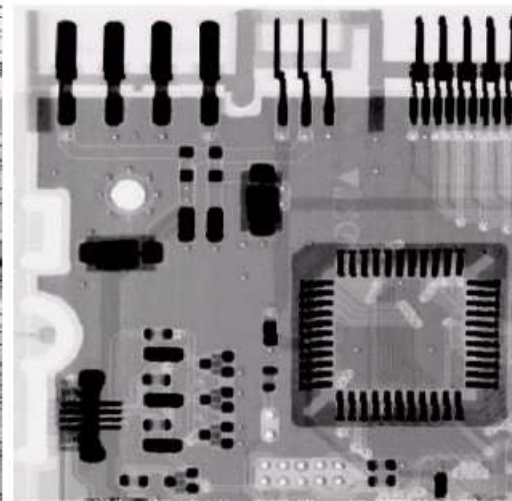
Image
Corrupted
By Salt
Noise



Result Of
Filtering
Above
With A 3*3
Max Filter



Result Of
Filtering
Above
With A 3*
Min Filte





Noise Removal Examples (cont...)

Image
Corrupted
By Uniform
Noise

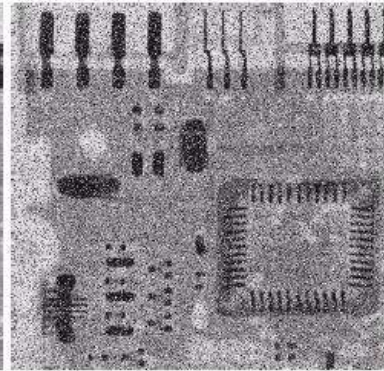
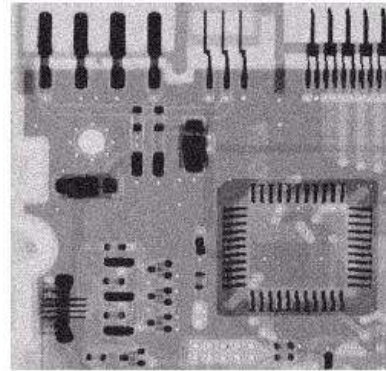
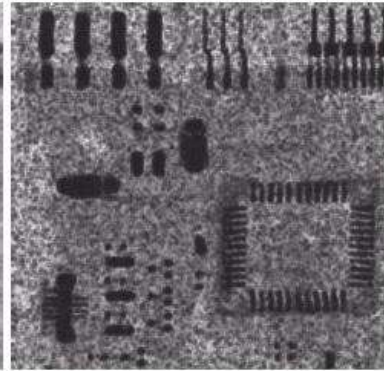
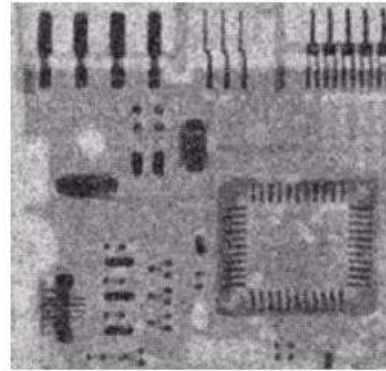


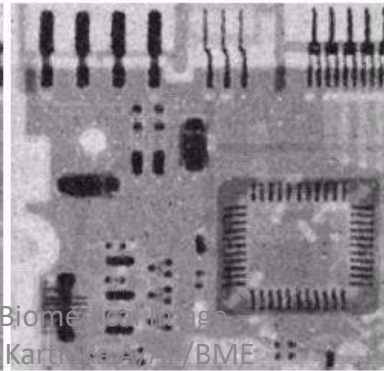
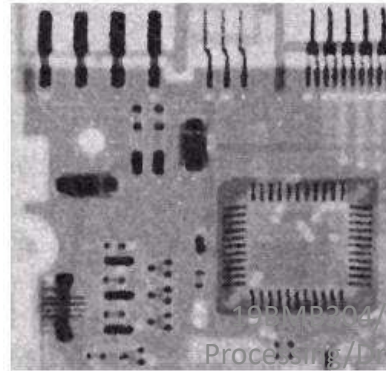
Image Further
Corrupted
By Salt and
Pepper Noise

Filtered By
5*5 Arithmetic
Mean Filter



Filtered By
5*5 Geometric
Mean Filter

Filtered By
5*5 Median
Filter



Filtered By
5*5 Alpha-Trimmed
Mean Filter

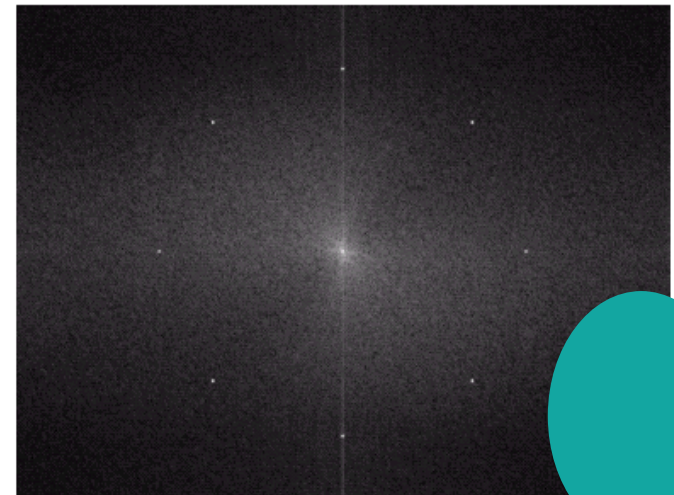
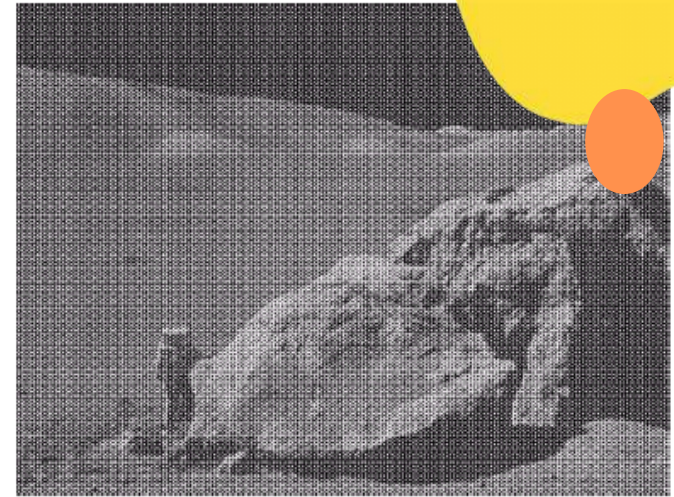


Periodic Noise

Typically arises due to electrical or electromagnetic interference

Gives rise to regular noise patterns in an image

Frequency domain techniques in the Fourier domain are most effective at removing periodic noise





Band Reject Filters

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:

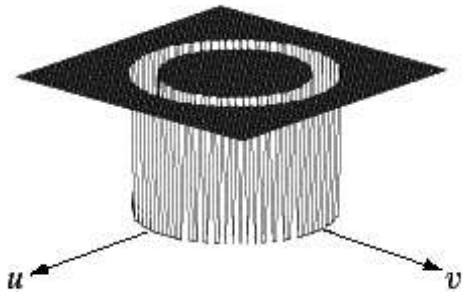
$$H(u, v) = \begin{cases} 1 & \text{if } D(u, v) < D_0 - \frac{W}{2} \\ 0 & \text{if } D_0 - \frac{W}{2} \leq D(u, v) \leq D_0 + \frac{W}{2} \\ 1 & \text{if } D(u, v) > D_0 + \frac{W}{2} \end{cases}$$



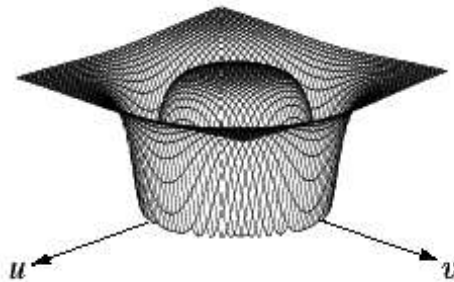
Band Reject Filters (cont...)



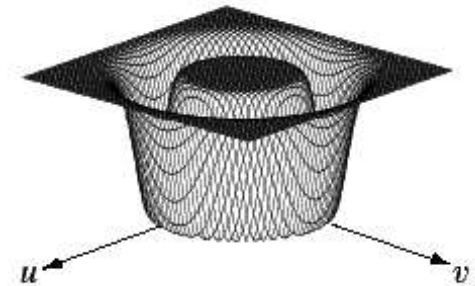
The ideal band reject filter is shown below, along with Butterworth and Gaussian versions of the filter



Ideal Band
Reject Filter



Butterworth
Band Reject
Filter (of order 1)

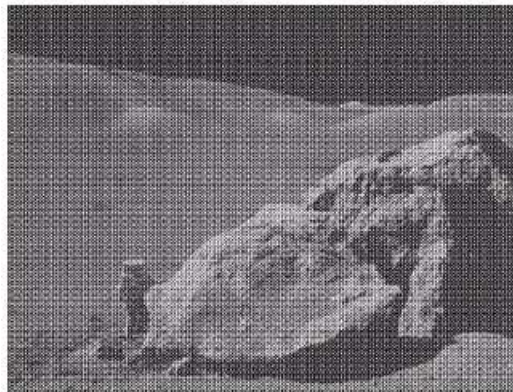


Gaussian
Band Reject
Filter

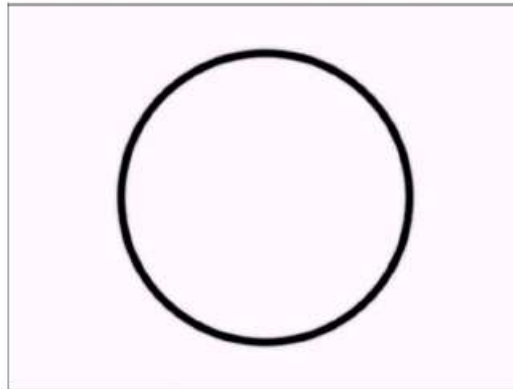


Band Reject Filter Example

Image corrupted by
sinusoidal noise



Fourier spectrum of
corrupted image



Butterworth band
reject filter



Filtered image



Thank You