

# Tutorial 4 Image Restoration and Filtering

COMP 4421: Image Processing

September 30, 2019

# Outline

- More about filtering in the frequency domain
- Noise Models
- Restoration in the Presence of Noise Only-Spatial Filtering

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# Properties of DFT

- Periodicity:
  - $F(u, v) = F(u + M, v) = F(u, v + N) = F(u + M, v + N)$
- Conjugate Symmetry:
  - $F(u, v) = F^*(-u, -v)$
  - $|F(u, v)| = |F^*(-u, -v)|$
- Translation

Translation in the image plane

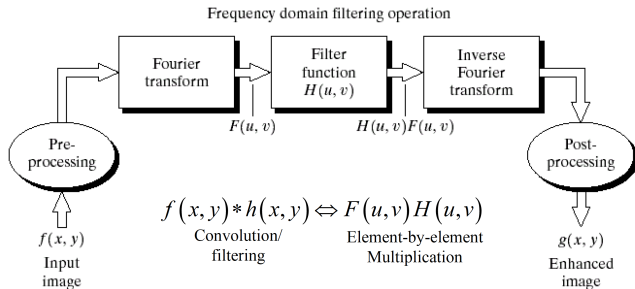
$$f(x - x_0, y - y_0) \Leftrightarrow F(u, v) e^{j2\pi(u_0x/M + v_0y/N)}$$

Translation in the frequency plane

$$f(x, y) e^{j2\pi(u_0x/M + v_0y/N)} \Leftrightarrow F(u - u_0, v - v_0)$$

# Another Idea for Filtering in Frequency Domain

- Based on Convolution Theory



- Padding Problems: Zero(black boundaries), Periodic, No-padding
- Wraparound Error

# Wraparound Error

- Multiplication in the frequency domain corresponds with circular convolution in the spatial domain.
- Without padding, results from one side of the image will wrap around to the other side of the image
- Zero padding:

$$f_p(x, y) = \begin{cases} f(x, y) & 0 \leq x \leq A - 1 \text{ and } 0 \leq y \leq B - 1 \\ 0 & A \leq x \leq P \text{ or } B \leq y \leq Q \end{cases} \quad (1)$$

$$h_p(x, y) = \begin{cases} h(x, y) & 0 \leq x \leq C - 1 \text{ and } 0 \leq y \leq D - 1 \\ 0 & C \leq x \leq P \text{ or } D \leq y \leq Q \end{cases} \quad (2)$$

where  $P \geq A + C - 1$  and  $Q \geq B + D - 1$ .

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# Noise Models

- Gaussian Noise
- Rayleigh Noise
- Gamma Noise
- Exponential Noise
- Uniform Noise
- Impulse (Salt & Pepper) Noise



# Noise Models

**Matlab Code** (add noise to image)

```
x=imread('camera.ras');  
figure,imshow(x);  
% salt & pepper noise added to image  
y1=imnoise(x,'salt & pepper');  
figure,imshow(y1);  
y2=imnoise(x,'salt & pepper',0.2);  
figure,imshow(y2);  
g = imnoise(x, 'gaussian', 0, 0.01);  
figure, imshow(g);  
g = imnoise(x, 'gaussian', 0, 0.1);  
figure, imshow(g);
```

# Function `imnoise()`

**Function** `r = imnoise(f, type, parameters)`

- Corrupt image `f` with noise specified in `type` and `parameters`
- Results returned in `r`
- Type include:

Value	Description
'gaussian'	Gaussian white noise with constant mean and variance
'localvar'	Zero-mean Gaussian white noise with an intensity-dependent variance
'poisson'	Poisson noise
'salt & pepper'	On and off pixels
'speckle'	Multiplicative noise

# Salt & Pepper



# Gaussian



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# Restoration in the Presence of Noise Only-Spatial Filtering

- Mean Filters
  - Arithmetic mean filter
  - Geometric mean filter
  - Harmonic mean filter
  - Contraharmonic mean filter
- Order-Statistics Filters
  - Median filter
  - Max and min filters
  - Midpoint filter
  - Alpha-trimmed mean filter
- Adaptive Spatial Filters
  - Adaptive, local noise reduction filter
  - Adaptive median filter

# Restoration in the Presence of Noise Only-Spatial Filtering

**Function** `f = spfilt(g, type, m, n, parameter)`

- Performs spatial filtering
- Type include:
  - **Mean Filters**  
amean, gmean, hmean, chmean
  - **Order-Statistics Filters**  
median, max, min, midpoint, artimmed

Reference: Gonzalez R C, Woods R E, Eddins S L. Digital image processing using MATLAB[M]. Knoxville: Gatesmark Publishing, 2009.

# Restoration in the Presence of Noise Only-Spatial Filtering

- Creating a pepper noise image

```
f = imread('lenna.jpg');  
R = imnoise2('salt & pepper', M, N, 0.1, 0);  
c = find(R == 0);  
gp = f;  
gp(c) = 0;  
figure, imshow(gp);
```

- Filtering

```
fp = spfilt(gp, 'amean', 5, 5);  
fpm = spfilt(gp, 'median', 5, 5);  
fpmax = spfilt(gp, 'max', 2, 2);  
figure, imshow(fp);  
figure, imshow(fpm);  
figure, imshow(fpmax);
```



## Function imnoise2( )

**Function** `R = imnoise2(type, M,N,a,b);`

- Generates R of size M-by-N
- 'a' and 'b' are parameters
- Type include:  
Gaussian Noise; Rayleigh Noise; Gamma Noise; Exponential Noise; Uniform Noise; Salt & Pepper Noise; Lognormal Noise

Reference: Gonzalez R C, Woods R E, Eddins S L. Digital image processing using MATLAB[M]. Knoxville: Gatesmark Publishing, 2009.

# Example



Image corrupted by pepper noise with probability 0.1. Result images with arithmetic mean filter, median filter, max filter respectively.

# Thank you!