

COMPUTER VISION 1

Homework 8

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Computer Vision Report – Homework 8

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Question :

Write the following programs

1. Generate additive white Gaussian noise
2. Generate salt-and-pepper noise
3. Run box filter (3×3 , 5×5) on all noisy images
4. Run median filter (3×3 , 5×5) on all noisy images
5. Run opening followed by closing or closing followed by opening

* Generate additive white Gaussian noise Concept *

White Gaussian noise

$$I(nim, i, j) = I(im, i, j) + amplitude * N(0,1)$$

$N(0,1)$: Gaussian random variable with zero mean and st. dev. 1

amplitude determines signal-to-noise ratio, try 10, 30

Step1.

利用『`X =randn(512,512)`』函式產生一個高斯分布，透過亂數產生器(存為矩陣，大小為512*512對應參數為平均值為0，標準差為1)

Step2.

`N=amp*X`，如上面的公式，將高斯分布乘上一個amplitude(這裡指定為amp=10,30)

Step3

`image1(i,j)=image1(i,j)+N(i,j)`，最後將輸入的影像加上noise，並且依照每個像素點位置去慢慢拼回成原來的 lena 圖像。

Source code

```
clear;
close;
image = imread('lena.bmp');
figure;
imshow(image);
[height,width] = size(image);

amp = 30;
x = randn(512,512); %產生一個高斯分布在亂數產生器(儲存成矩陣，大小為 512*512
對應參數為平均值為 0，標準差為 1)
N = amp * x;
```

```

for i = 1 : height
    for j = 1 : width
        image(i,j) = image(i,j)+N(i,j);
    end
end

figure; imshow(image);
imwrite(image, 'gau_noise2.bmp');

```

Result

* amplitude = 10



Original image

Add with
Gaussian
noise



Gaussian noise image

* amplitude = 30



Original image

Add with
Gaussian
noise



Gaussian noise image

* Generate salt-and-pepper noise Concept *

Salt-and-pepper noise

$I(nim, i, j) = 0 \text{ if } uniform(0,1) < 0.05$

$I(nim, i, j) = 255 \text{ if } uniform(0,1) > 1 - 0.05$

$I(nim, i, j) = I(im, i, j) \text{ otherwise}$

uniform(0,1) : random variable uniformly distributed over [0,1]

try both 0.05 and 0.1

Step1.

利用『`X=rand(512,512)`』函式產生一個均勻分布於 0 到 1 之間的隨機亂數，(儲存成矩陣，大小為 512*512)。

Step2.

如上面的公式，再設置一個 `threshold=0.05`，以及 `1-threshold`，當作門檻值。再將均勻分布的亂數藉由門檻值定義成三種判別式。製造出類似白點和黑點的雜訊。

Step3.

`image1(i,j)=image1(i,j)+N(i,j)`，最後將輸入的影像加上noise，並且依照每個像素點位置去慢慢拼回成原來的 lena 圖像。

Source code

```
image=imread('lena.bmp');
figure; imshow(image);
[height,width]=size(image);
X=rand(512,512);

p=0.05;
pp=1-p;
for i=1:height
    for j=1:width
        if X(i,j)<p
            image(i,j)=0;
        else if X(i,j)>pp
```

```

        image(i,j)=255;
    else
        image(i,j)=image(i,j);
    end
end
end

figure; imshow(image);
imwrite(image,'sap_noisel.bmp');

```

Result

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

* threshold = 0.1



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

* Run Box filter (3X3) on all noisy images *

Box filter

$$3 \times 3 \text{ boxfilter : } B = \frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

Step1.

利用『`filtered_img = zeros(height,width)`』函式產生一個和輸入影像大小相等的為零矩陣(用途為：最後將 3×3 box filter 權重分配至原圖像後最終值可以存回此矩陣 =output image)。

Step2.

如上面的範例操作，利用 4 個 `for` 迴圈 `sum=sum+image(k,l)`。
`filtered_img(i+1,j+1)=sum/9`，由於 3×3 box filter 矩陣值都為1，因此直接將 `image` 累加，最後除上9，表示此矩陣的所有像素總和(做normalization)

Step3.

`filtered_img(i+1,j+1) = mean2(image(i:i+2,j:j+2))`，最後將輸入的影像透過 filter 去除掉 noise，並且依照每個像素點位置去慢慢拼回成原來的 lena 圖像。

Source code

```
function [filtered_img]=boxthree(image)

image=imread('sap_noise2.bmp');

figure;

imshow(image);
```

```

[height,width] = size(image);

filtered_img = zeros(height,width);

for i = 1:height-2

for j = 1:width-2

sum =0;

for k = i:i+2

for l = j:j+2

sum=sum+image(k,l);

filtered_img(i+1,j+1)=sum/9;

end

end

filtered_img(i+1,j+1) = mean2(image(i:i+2,j:j+2));

end

end

filtered_img=uint8(filtered_img);

figure;

imshow(filtered_img);

imwrite(filtered_img,'boxthree_sap_noise2.bmp');

end

```

* amplitude = 10



Original image



Gaussian noise image

$$\frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

Add with
Gaussian
noise

Multiply a 3x3
box filter to
remove noise



After 3*3 box filter remove noise

* amplitude = 30



Original image



Gaussian noise image

$$\frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

Add with
Gaussian
noise
→
Multiply a 3x3
box filter to
remove noise



After 3*3 box filter remove noise

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

$$\frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

Multiply a 3x3
box filter to
remove noise



After 3*3 box filter remove noise

* threshold = 0.1



Original image



Salt and pepper noise image

$$\frac{1}{9} \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

Add with
salt and
pepper
noise

→

Multiply a 3x3
box filter to
remove noise



After 3*3 box filter remove noise

* Run Box filter (5X5) on all noisy images *

Box filter

$$5 \times 5 \text{ boxfilter : } B = \frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

Step1.

利用『`filtered_img = zeros(height,width)`』函式產生一個和輸入影像大小相等的為零矩陣(用途為：最後將 5×5 box filter 權重分配至原圖像後最終值可以存回此矩陣 =output image)。

Step2.

如上面的範例操作，利用 4 個 for 迴圈 `sum=sum+image(k,l)`。
`filtered_img(i+1,j+1)=sum/25`，由於 5×5 box filter 矩陣值都為1，因此直接將 image 累加，最後除上25，表示此矩陣的所有像素總和(做normalization)

Step3.

`filtered_img(i+1,j+1) = mean2(image(i:i+4,j:j+4))`，最後將輸入的影像透過 filter 去除掉 noise，並且依照每個像素點位置去慢慢拼回成原來的 lena 圖像。

Source code

```
function [filtered_img]=boxfive(image)
```

```
image=imread('sap_noise2.bmp');
```

```

figure;

imshow(image);

[height,width] = size(image);

filtered_img = zeros(height,width);

for i = 1:height-4

    for j = 1:width-4

        sum =0;

        for k = i:i+4

            for l = j:j+4

                sum=sum+image(k,l);

            end

            filtered_img(i+1,j+1)=sum/25;

        end

    end

    filtered_img(i+1,j+1) = mean2(image(i:i+4,j:j+4));

end

end

filtered_img=uint8(filtered_img);

figure;

imshow(filtered_img);

imwrite(filtered_img,'boxfive_sap_noise2.bmp');

end

```

* amplitude = 10



Original image



Gaussian noise image

$$\frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

Add with
Gaussian
noise

Multiply a 5x5
box filter to
remove noise



After 5*5 box filter remove noise

* amplitude = 30



Original image



Gaussian noise image

$$\frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

Add with
Gaussian
noise

Multiply a 5x5
box filter to
remove noise



After 5*5 box filter remove noise

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

$$\frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$



Multiply a 5x5
box filter to
remove noise



After 5*5 box filter remove noise

* threshold = 0.1



Original image



Salt and pepper noise image

$$\frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$$

Add with
Salt and
pepper
noise

→

Multiply a 5x5
box filter to
remove noise



After 5*5 box filter remove noise

* Run Median filter (3X3) on all noisy images *

Median filter

The Median filter is used to remove noise from an image by replacing

pixels with the [middle pixel value](#) selected from a certain window size.

Step1.

3X3 Median filter，重新設計一個全為零的矩陣，大小則為原來輸入影像的大小

(M,N)的各邊長加 2→(M+2,N+2)。modifyimage=zeros(size(image)+2)。

Step2.

從原來輸入影像中的每點像素質 COPY 到新的矩陣，並且設計一個 window3*3(當

作判斷鄰近像素質中位數的求取)。

Step3.

將每一個 window 對應到影像中後，那一圈的 9 個像素質大小進行排序，利用到

『sort』函式進行，並且求出中間值=med，再將其儲存取代到 window 的中心

window(5)的位置。

Step4.

重複步驟 3 一直到整張影像都經過 median filter 後，將影像每個點像素儲存回去到

新的影像矩陣 B，之後記得轉換回 0-255 強度像素，使用『unit8』。

Source code

```
image1=imread('sap_noise2.bmp');
figure,imshow(image1);

%PAD THE MATRIX WITH ZEROS ON ALL SIDES

modifyimage1=zeros(size(image1)+2);
B=zeros(size(image1));

%COPY THE ORIGINAL IMAGE MATRIX TO THE PADDED MATRIX

for x=1:size(image1,1)
    for y=1:size(image1,2)
        modifyimage1(x+1,y+1)=image1(x,y);
    end
end

%LET THE WINDOW BE AN ARRAY

%STORE THE 3-by-3 NEIGHBOUR VALUES IN THE ARRAY

%SORT AND FIND THE MIDDLE ELEMENT

for i= 1:size(modifyimage1,1)-2
    for j=1:size(modifyimage1,2)-2
        window=zeros(9,1);
        inc=1;
        for x=1:3
            for y=1:3
                window(inc)=modifyimage1(i+x-1,j+y-1);
                inc=inc+1;
            end
        end
        med=sort(window);

        %PLACE THE MEDIAN ELEMENT IN THE OUTPUT MATRIX

        B(i,j)=med(5);
    end
end

%CONVERT THE OUTPUT MATRIX TO 0-255 RANGE IMAGE TYPE

B=uint8(B);
figure,imshow(B);
imwrite(B, 'medianthree_sap_noise2.bmp');
```

* amplitude = 10



Original image



Gaussian noise image

$$\begin{bmatrix} 12 & 77 & 17 \\ 6 & \textcolor{red}{54} & 33 \\ 80 & 27 & 3 \end{bmatrix}$$

Multiply a 3x3
Median filter
to remove



After 3*3 Median filter remove noise

* amplitude = 30



Original image



Gaussian noise image

$$\begin{bmatrix} 12 & 77 & 17 \\ 6 & \textcolor{red}{54} & 33 \\ 80 & 27 & 3 \end{bmatrix}$$

Multiply a 3x3
Median filter
to remove



After 3*3 Median filter remove noise

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

$$\begin{bmatrix} 12 & 77 & 17 \\ 6 & \textcolor{red}{54} & 33 \\ 80 & 27 & 3 \end{bmatrix}$$

Multiply a 3x3
Median filter
to remove



After 3*3 Median filter remove noise

* threshold = 0.1



Original image



Salt and pepper noise image

$$\begin{bmatrix} 12 & 77 & 17 \\ 6 & \textcolor{red}{54} & 33 \\ 80 & 27 & 3 \end{bmatrix}$$

Add with
Salt and
pepper
noise

→

Multiply a 3x3
Median filter
to remove



After 3*3 Median filter remove noise

* Run Median filter (5X5) on all noisy images *

Median filter

The Median filter is used to remove noise from an image by replacing

pixels with the [middle pixel value](#) selected from a certain window size.

Step1.

5X5 Median filter · 重新設計一個全為零的矩陣 · 大小則為原來輸入影像的大小

(M,N)的各邊長加 4→(M+4,N+4) · `modifyimage=zeros(size(image)+4)` 。

Step2.

從原來輸入影像中的每點像素質 COPY 到新的矩陣 · 並且設計一個 `window5*5`(當

作判斷鄰近像素質中位數的求取)。

Step3.

將每一個 `window` 對應到影像中後 · 那一圈的 25 個像素質大小進行排序 · 利用到

『`sort`』函式進行 · 並且求出中間值=`med` · 再將其儲存取代到 `window` 的中心

`window(13)`的位置。

Step4.

重複步驟 3 一直到整張影像都經過 `median filter` 後 · 將影像每個點像素儲存回去到

新的影像矩陣 `B` · 之後記得轉換回 0-255 強度像素 · 使用『`unit8`』。

Source code

```
image1=imread('sap_noise2.bmp');
figure,imshow(image1);

%PAD THE MATRIX WITH ZEROS ON ALL SIDES
modifyimage1=zeros(size(image1)+4);
B=zeros(size(image1));
%COPY THE ORIGINAL IMAGE MATRIX TO THE PADDED MATRIX
for x=1:size(image1,1)
    for y=1:size(image1,2)
        modifyimage1(x+1,y+1)=image1(x,y);
    end
end
%LET THE WINDOW BE AN ARRAY
%STORE THE 3-by-3 NEIGHBOUR VALUES IN THE ARRAY
%SORT AND FIND THE MIDDLE ELEMENT
for i= 1:size(modifyimage1,1)-4
    for j=1:size(modifyimage1,2)-4
        window=zeros(25,1);
        inc=1;
        for x=1:5
            for y=1:5 window(inc)=modifyimage1(i+x-1,j+y-1);
            inc=inc+1;
        end
        end
        med=sort(window);
        %PLACE THE MEDIAN ELEMENT IN THE OUTPUT MATRIX
        B(i,j)=med(13);
    end
end
%CONVERT THE OUTPUT MATRIX TO 0-255 RANGE IMAGE TYPE
B=uint8(B);
figure,imshow(B);
imwrite(B, 'medianfive_sap_noise2.bmp');
```

* amplitude = 10



Original image



Gaussian noise image

$$\begin{bmatrix} 12 & 52 & 3 & 1 & 30 \\ 1 & 13 & 27 & 59 & 30 \\ 11 & 22 & 77 & 5 & 11 \\ 32 & 98 & 72 & 6 & 14 \\ 44 & 1 & 78 & 12 & 17 \end{bmatrix}$$

Add with
Gaussian
noise
→
Multiply a 5x5
Median filter
to remove
noise



After 5*5 Median filter remove noise

* amplitude = 30



Original image



Gaussian noise image

$$\begin{bmatrix} 12 & 52 & 3 & 1 & 30 \\ 1 & 13 & 27 & 59 & 30 \\ 11 & 22 & 77 & 5 & 11 \\ 32 & 98 & 72 & 6 & 14 \\ 44 & 1 & 78 & 12 & 17 \end{bmatrix}$$

Add with
Gaussian
noise
→
Multiply a 5x5
Median filter
to remove
noise



After 5*5 Median filter remove noise

* threshold = 0.05



Original image

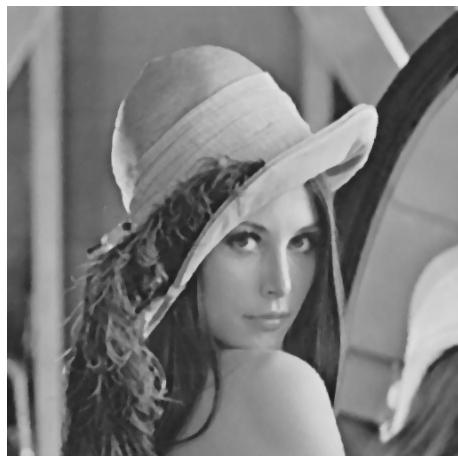
Add with
Salt and
pepper
noise



Salt and pepper noise image

$$\begin{bmatrix} 12 & 52 & 3 & 1 & 30 \\ 1 & 13 & 27 & 59 & 30 \\ 11 & 22 & 77 & 5 & 11 \\ 32 & 98 & 72 & 6 & 14 \\ 44 & 1 & 78 & 12 & 17 \end{bmatrix}$$

Multiply a 5x5
Median filter
to remove
noise



After 5*5 Median filter remove noise

* threshold = 0.1



Original image



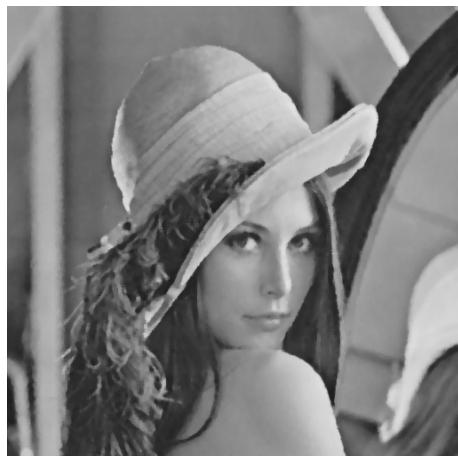
Salt and pepper noise image

$$\begin{bmatrix} 12 & 52 & 3 & 1 & 30 \\ 1 & 13 & 27 & 59 & 30 \\ 11 & 22 & 77 & 5 & 11 \\ 32 & 98 & 72 & 6 & 14 \\ 44 & 1 & 78 & 12 & 17 \end{bmatrix}$$

Add with
Salt and
pepper
noise

→

Multiply a 5x5
Median filter
to remove
noise



After 5*5 Median filter remove noise

* Run opening followed by closing or closing followed by opening*

opening followed by closing

先進行 opening 再進行 closing

closing followed by opening

先進行 closing 再進行 opening

1. opening

$$f_{opening} = f \circ K$$

$$(f \ominus K) \oplus K$$

先求 Erosion 再求 Dilation

2. closing

$$f_{closing} = f \bullet K$$

$$(f \oplus K) \ominus K$$

先求 Dilation 再求 Erosion

Using octagonal kernel $K = \frac{1}{25} \begin{bmatrix} 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 & 1 \end{bmatrix}$

Source code (Main code)

```
%% programs which do gray scale morphological opening, closing,  
transform on a binary image  
  
clc;  
  
clear all;  
  
close all;  
  
%input=imread('sap_noise1.bmp');  
  
I=imread('gau_noise1.bmp');  
  
  
  
K=[0 1 1 1 0; 1 1 1 1 1; 1 1 1 1 1; 1 1 1 1 1; 0 1 1 1 0];  
  
Kc=[3,3];  
  
  
  
img_open=GrayImageOpening(I,K,Kc,1);  
  
outputOC=GrayImageClosing(img_open,K,Kc,1);  
  
figure;  
  
imshow(outputOC);  
  
imwrite(outputOC,'OC_gau_noise1.bmp');  
  
  
  
img_close=GrayImageClosing(I,K,Kc,1);  
  
outputCO=GrayImageOpening(img_close,K,Kc,1);  
  
figure;  
  
imshow(outputCO);  
  
imwrite(outputCO,'CO_gau_noise1.bmp');
```

Source code (Gray Image Dilation Function)

```
function output=GrayImageDilation(input,K,Kc,showImg)

if ~exist('showImg')
    showImg=0;
end

[im_height,im_width]=size(input);
% Find the coordinate where '1' exists
[Krow,Kcol]=find(K);
Krow=Krow-Kc(1); % Relative position which kernel center is at (0,0)
Kcol=Kcol-Kc(2);
% Minimum and maximum distance between the origin and the borders of
K
% To avoid asymmetrical kernel, we use 4 parameters.
min_h=-min(Krow);
max_h=max(Krow);
min_w=-min(Kcol);
max_w=max(Kcol);

im_tmp=zeros(im_height+min_h+max_h, im_width+min_w+max_w);
im_tmp(min_h+1:min_h+im_height, min_w+1:min_w+im_width)=input;
output=zeros(im_height, im_width);

% Process for dilation
for c=1:im_width
    for r=1:im_height
        x=c+Krow+min_h;
        y=r+Kcol+min_w;
        abc=(x-1)*size(im_tmp,1)+y;
        output(r,c)=max(im_tmp(abc));
    end
end
```

Source code (Gray Image Erosion Function)

```
function output=GrayImageErosion(input,K,Kc,showImg)
if ~exist('showImg')
    showImg=0;
end

[im_height,im_width]=size(input);
% Find the coordinate where '1' exists
[Krow,Kcol]=find(K);
Krow=Krow-Kc(1); % Relative position which kernel center is at (0,0)
Kcol=Kcol-Kc(2);

min_h=-min(Krow);
max_h=max(Krow);
min_w=-min(Kcol);
max_w=max(Kcol);

im_tmp=255*ones(im_height+min_h+max_h, im_width+min_w+max_w);
im_tmp(min_h+1:min_h+im_height, min_w+1:min_w+im_width)=input;
output=zeros(im_height, im_width);

% Process for dilation
for c=1:im_width
    for r=1:im_height
        x=c+Krow+min_h;
        y=r+Kcol+min_w;
        abc=(x-1)*size(im_tmp,1)+y;
        output(r,c)=min(im_tmp(abc)); lean ??? ????????
    end
end

output=uint8(output);
```

Source code (Gray Image Opening Function)

```
function output=GrayImageOpening(input,K,Kc,showImg)

if ~exist('showImg')
    showImg=0;
end

% 先 Erosion 在 Dilatation

img_ero=GrayImageErosion(input,K,Kc);
output=GrayImageDilation(img_ero,K,Kc);

if showImg~=0
    figure;
    imshow(output);
    title('Opening');
    imwrite(output,'Opening.bmp')
end
end
```

Source code (Gray Image Closing Function)

```
function output=GrayImageClosing(input,K,Kc,showImg)

if ~exist('showImg')
    showImg=0;

end

% ? Dilation ? Erosion

img_dil=GrayImageDilation(input,K,Kc);

output=GrayImageErosion(img_dil,K,Kc);

if showImg~=0
    figure;
    imshow(output);
    title('Closing');
    imwrite(output,'Closing.bmp')
end
end
```

* amplitude = 10



Original image

Add with
Gaussian
noise



Gaussian noise image

先 Opening
再 Closing



After opening first and then closing

* amplitude = 30



Original image



Gaussian noise image

Add with
Gaussian
noise



先 Opening
再 Closing



After opening first and then closing

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

先 Opening
再 Closing



After opening first and then closing

* threshold = 0.1



Original image



Salt and pepper noise image



先 Opening
再 Closing



After opening first and then closing

* amplitude = 10



Original image

Add with
Gaussian
noise



Gaussian noise image

先 Closing
再 Opening



After closing first and then opening

* amplitude = 30



Original image



Gaussian noise image

Add with
Gaussian
noise



先 Closing
再 Opening



After closing first and then opening

* threshold = 0.05



Original image

Add with
Salt and
pepper
noise



Salt and pepper noise image

先 Closing

再 Opening



After closing first and then opening

* threshold = 0.1



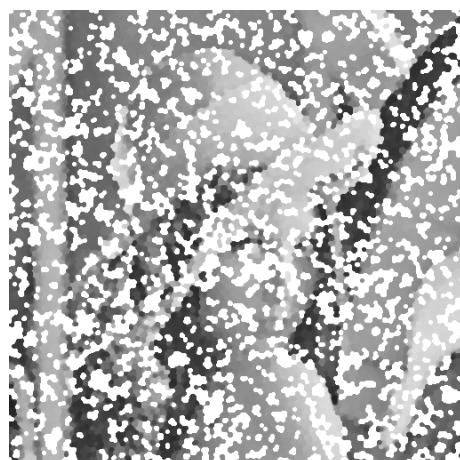
Original image



Salt and pepper noise image



先 Closing
再 Opening



After closing first and then opening

* calculate the signal-to-ratio (SNR) for each instance *

signal-to-ratio (SNR)

by formula :

$$VS = \frac{\sum_{\forall n} (I(i, j) - \mu)^2}{\|n\|}$$
$$\mu = \frac{\sum_{\forall n} I(i, j)}{\|n\|}$$
$$VN = \frac{\sum_{\forall n} (I_N(i, j) - I(i, j) - \mu_N)^2}{\|n\|}$$
$$\mu_N = \frac{\sum_{\forall n} (I_N(i, j) - I(i, j))}{\|n\|}$$
$$SNR = 20 \log_{10} \frac{\sqrt{VS}}{\sqrt{VN}}$$

※先計算原輸入影像無雜訊Lena圖像的像素期望值和變異數，再計算含有雜訊的前面五題的輸出結果圖之像素期望值和變異數，最後再將兩者變異數帶入SNR公式取 \log 。

Source code (signal-to-ratio (SNR) Function)

```
function outputsnr=snr(image_noise,image_ori)

image_noise=imread('OC_sap_noisel.bmp');
image_ori=imread('lena.bmp');
[height1,width1]=size(image_ori);
mean=0;
meanN=0;
vs=0;
vn=0;

for i=1:height1;
    for j=1:width1;
        mean=double(mean+image_ori(i,j));
        meanN=double(meanN+(image_noise(i,j)-image_ori(i,j)));
    end
end

mean=mean./(height1.*width1);
meanN=meanN./(height1.*width1);

for i=1:height1;
    for j=1:width1;
        tem1=double(image_ori(i,j)-mean);
        vs=vs+(tem1.*tem1);
        tem2=double(image_noise(i,j)-image_ori(i,j)-meanN);
        vn=vn+(tem2.*tem2);
    end
end

vs=vs./(height1*width1);
vn=vn./(height1*width1);

outputsnr=20.*log10(sqrt((vs./vn)));
end
```

Comparison

*signal-to-ratio (SNR)

$$SNR = 20 \log_{10} \left(\frac{A_{signal}}{A_{noise}} \right)$$

1. Without filter (only noise)
2. 3x3 box filter
3. 5x5 box filter
4. 3x3 median filter
5. 5x5 median filter
6. Opening followed by closing
7. Closing followed by opening

| | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|----------|-------|-------|-------|-------|-------|-------|-------|
| GAU 10 | 13.57 | 16.37 | 13.59 | 17.54 | 15.81 | 13.25 | 13.62 |
| GAU 30 | 4.18 | 12.13 | 12.36 | 11.00 | 12.58 | 11.16 | 11.18 |
| SAP 0.05 | 0.88 | 9.20 | 10.53 | 18.89 | 15.93 | 5.26 | 5.19 |
| SAP 0.1 | -2.08 | 6.26 | 8.22 | 14.41 | 14.15 | -2.12 | -2.57 |

*MSE

$$MSE = \frac{1}{n} \sum_{i=1}^n (\hat{Y}_i - Y_i)^2$$

1. Without filter (only noise)
2. 3x3 box filter
3. 5x5 box filter
4. 3x3 median filter
5. 5x5 median filter
6. Opening followed by closing
7. Closing followed by opening

| | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|----------|---------|--------|--------|--------|--------|---------|---------|
| GAU 10 | 100.62 | 52.89 | 100.47 | 40.35 | 60.11 | 251.65 | 227.82 |
| GAU 30 | 874.35 | 140.04 | 133.22 | 181.91 | 126.56 | 1359.51 | 1341.12 |
| SAP 0.05 | 1869.58 | 274.79 | 202.30 | 29.56 | 58.45 | 820.47 | 833.62 |
| SAP 0.1 | 3703.90 | 541.31 | 344.82 | 82.92 | 88.21 | 6069.71 | 6905.31 |