

NTUT, Graduate Institute of Automation Technology

Digital Image Processing Instructor : Chen

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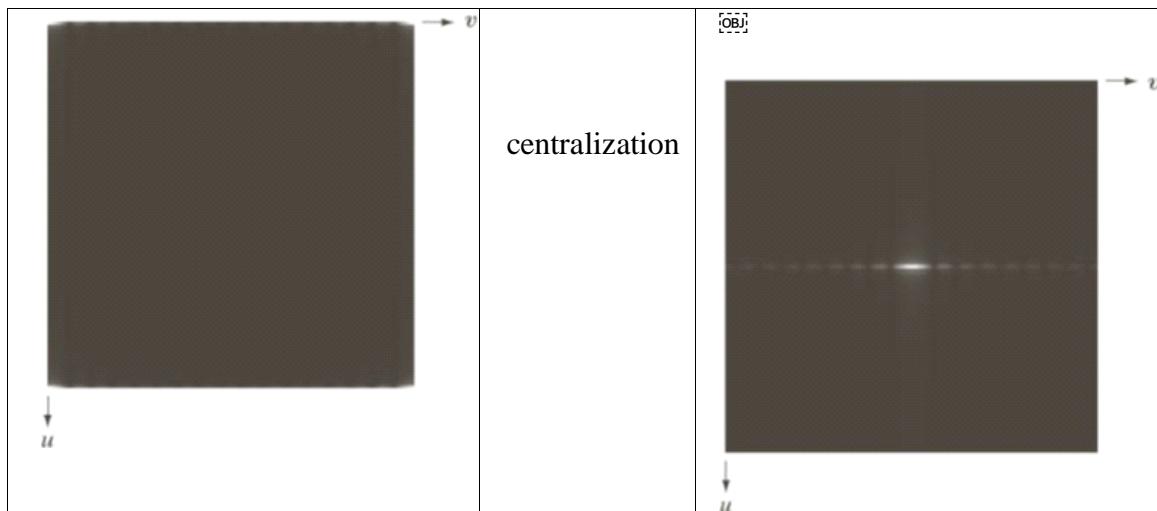
Homework Assignment #3

Due date: 2022/12/06

1. (20%) Spectrum shift property

(1) Prove that $f(x, y)e^{j2\pi(u_0x/M+u_0y/N)} \Leftrightarrow F(u-u_0, v-v_0)$.

(2) If you want to center the spectrum, show in the following figures, what process you need to do. Please prove it from the result of (a).

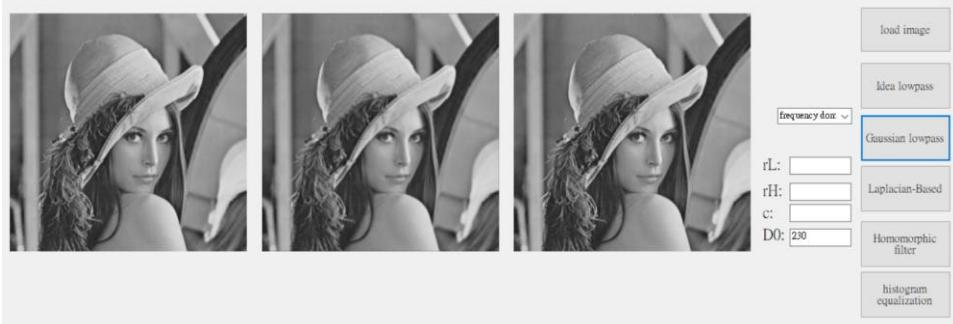


2. (40%) Programming smoothing and sharpening enhancement in frequency domain:
- (1) Take the ideal and Gaussian lowpass filters for Fig. 4.40 (4th global edition) and your own image by frequency-domain approach. Comparing the results with the spatial mask filtering.

ILPF_Filter



Gaussian lowpass filters



左圖第一張為原始圖，中間為 time domin，右邊為 frequency domin。

```
public void GLPF_Filter(IntPtr src, IntPtr src2, PictureBox pictureBox)
{
    int Width = iImage.GetWidth(src);
    int Height = iImage.GetHeight(src);
    int pad_Width = Width * 2;
    int pad_Height = Height * 2;
    byte[,] Imagematrix = new byte[Height, Width];
    double[,] pad_matrix = new double[pad_Height, pad_Width];
    err = iImage.iPointerFromImage(Image, ref Imagematrix[0, 0], Width, Height);
    print_error(err);
    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            pad_matrix[i, j] = Imagematrix[i, j];
        }
    }
    Fftshift(pad_matrix, pad_Height, pad_Width);
    Complex[,] F = new Complex[pad_Height, pad_Width];

    for (int i = 0; i < pad_Height; i++)
    {
        for (int j = 0; j < pad_Width; j++)
        {
            F[i, j] = (Complex)pad_matrix[i, j];
        }
    }
    FourierTransform.FFT2(F, FourierTransform.Direction.Forward);
```

```

double d0 = Convert.ToDouble(tb_d0.Text);
double n = pad_Height / 2;
double m = pad_Width / 2;

Complex[,] H = new Complex[pad_Height, pad_Width];
Complex[,] G = new Complex[pad_Height, pad_Width];

for (int i = 0; i < pad_Height; i++)
{
    for (int j = 0; j < pad_Width; j++)
    {
        double d = Math.Sqrt(Math.Pow((i - n), 2) + Math.Pow((j - m), 2));
        H[i, j] = (Complex)Math.Exp((-1 * d) / (2 * d0 * d0));
        G[i, j] = F[i, j] * H[i, j];
    }
}
FourierTransform.FFT2(G, FourierTransform.Direction.Backward);

for (int i = 0; i < pad_Height; i++)
{
    for (int j = 0; j < pad_Width; j++)
    {
        pad_matrix[i, j] = Convert.ToDouble(G[i, j].Re);
    }
}
Fftshift(pad_matrix, pad_Height, pad_Width);
for (int i = 0; i < Height; i++)
{
    for (int j = 0; j < Width; j++)
    {
        Imagematrix[i, j] = Convert.ToByte(pad_matrix[i, j]);
    }
}

```

```

void Fftshift(double[,] data, int h, int w)
{
    int Height = h, Width = w;
    double[,] tmp = new double[Height, Width];
    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            tmp[i, j] = Convert.ToDouble(data[i, j] * Math.Pow(-1, i + j));
        }
    }
    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            data[i, j] = tmp[i, j];
        }
    }
}
public void Gaussian_3_3_Filter(IntPtr src, IntPtr src2, PictureBox pictureBox)
{
    int Width = iImage.GetWidth(src);
    int Height = iImage.GetHeight(src);
    byte[,] imagematrix = new byte[Height, Width];
    byte[,] imagematrix_af = new byte[Height, Width];
    int mask_size = 3;
    double[,] Gaussian_filter = new double[mask_size, mask_size];
    err = iImage.iPointerFromImage(Image, ref Imagematrix[0, 0], Width, Height);
    print_error(err);
    double sigma = 7;
    double mask_total = 0;
    for (int i = 0; i < mask_size; i++)
    {
        for (int j = 0; j < mask_size; j++)
        {
            Gaussian_filter[i, j] = (1 / (2 * Math.PI * sigma * sigma)) *
                Math.Exp(-1 * (Math.Pow(i - (mask_size / 2), 2) + Math.Pow(j - (mask_size / 2), 2)) / (2 * sigma * sigma));
            mask_total += Gaussian_filter[i, j];
        }
    }
    double number = 0;
    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            number = 0;
            for (int s = -1 * (mask_size / 2); s < (mask_size / 2) + 1; s++)
            {
                for (int t = -1 * (mask_size / 2); t < (mask_size / 2) + 1; t++)
                {
                    if ((i + s) >= 0 && (i + s) < Height && (j + t) >= 0 && (j + t) < Width)
                    {
                        number += Imagematrix[i + s, j + t] * Gaussian_filter[s + (mask_size / 2), t + (mask_size / 2)];
                    }
                    else
                    {
                        number += 0 * Gaussian_filter[s + (mask_size / 2), t + (mask_size / 2)];
                    }
                }
            }
            number = number / mask_total;
            if (number > 255)
            {
                number = 255;
            }
        }
    }
}

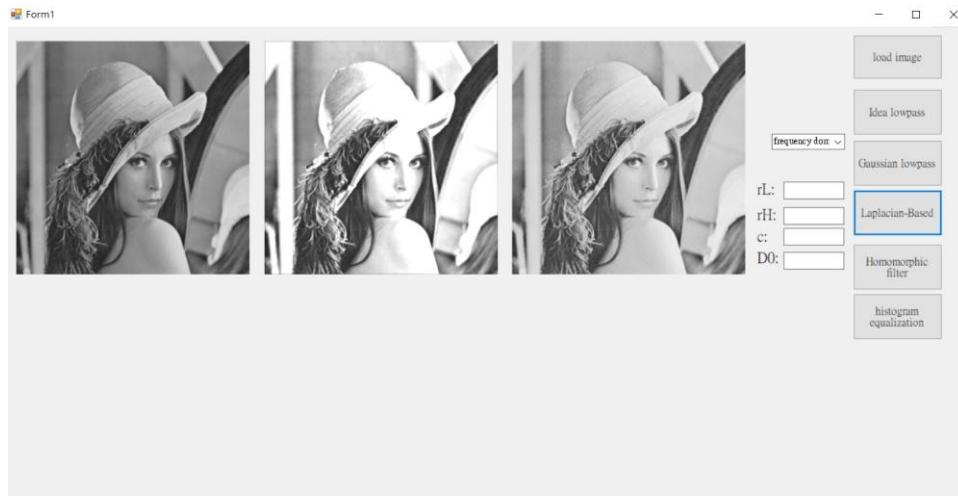
```

```

        if (number < 0)
    {
        number = 0;
    }
    Imagematrix_af[i, j] = (Byte)number;
}
}

```

- (2) Take Laplacian-Based Enhancement for both “Lena image” and your own image by frequency-domain approach. Comparing the results with spatial enhancement.



左圖第一張為原始圖，中間為 time domin，右邊為 frequency domin。

```

public void Lapl_Filter(IntPtr src, IntPtr src2, PictureBox pictureBox)
{
    int Width = iImage.GetWidth(src);
    int Height = iImage.GetHeight(src);
    int sWidth = Width, sHeight = Height;
    byte[,] Graymatrix = new byte[Height, Width];
    err = iImage.iPointerFromImage(src, ref Graymatrix[0, 0], Width, Height);

    int paddingWidth = Convert.ToInt32(Math.Pow(2, (int)(Math.Ceiling(Math.Log(Convert.ToDouble(Width), 2))) + 1)); //轉換成2^n次方
    int paddingHeight = Convert.ToInt32(Math.Pow(2, (int)(Math.Ceiling(Math.Log(Convert.ToDouble(Height), 2))) + 1)); //假設510=>2^9，在加一，2^10

    double[,] paddingmatrix = new double[paddingHeight, paddingWidth];
    AForge.Math.Complex[,] bigmatrix = new AForge.Math.Complex[paddingHeight * 2, paddingWidth * 2];

    for (int i = 0; i < Height; i++)
        for (int j = 0; j < Width; j++)
            paddingmatrix[i, j] = Graymatrix[i, j]; //把影像複製過去不包括邊緣

    for (int i = 0; i < paddingHeight * 2; i++)
        for (int j = 0; j < paddingWidth * 2; j++)
            if (i < paddingHeight && j < paddingWidth)
                bigmatrix[i, j].Re = Math.Pow(-1, i + j) * paddingmatrix[i, j] / 255; //(-1)^(x+y)
            else
                bigmatrix[i, j].Re = 0;

    AForge.Math.FourierTransform.FFT2(bigmatrix, AForge.Math.FourierTransform.Direction.Forward); //fft轉換
}

```

```

for (int i = 0; i < paddingHeight * 2; i++)
    for (int j = 0; j < paddingWidth * 2; j++)
        bigmatrix[i, j] = bigmatrix[i, j] * (4 * Math.Pow(Math.PI, 2) * (Math.Pow(i - sHeight / 2, 2) + Math.Pow(j - sWidth / 2, 2))); //Laplac
AForge.Math.FourierTransform.FFT2(bigmatrix, AForge.Math.FourierTransform.Direction.Backward); //ifft轉換
double min = 100;
double max = 0;

for (int i = 0; i < 2 * paddingHeight; i++)
    for (int j = 0; j < 2 * paddingWidth; j++)
    {
        if (bigmatrix[i, j].Re > 0)
            bigmatrix[i, j].Re = (int64)(bigmatrix[i, j].Re + 0.5); //進位
        else
            bigmatrix[i, j].Re = 0;
        if (bigmatrix[i, j].Re > max) //紀錄大小(歸一化用)
            max = bigmatrix[i, j].Re;
        else if (bigmatrix[i, j].Re < min) //紀錄大小(歸一化用)
            min = bigmatrix[i, j].Re;
    }

byte[,] fouriermatrix = new byte[Height, Width];
for (int i = 0; i < Height; i++)
    for (int j = 0; j < Width; j++)
    {
        fouriermatrix[i, j] = (byte)((bigmatrix[i, j].Re - min) * (255 / (max - min))) + Graymatrix[i, j]; //歸一化最大值255追加原本的圖
        if (((bigmatrix[i, j].Re - min) * (255 / (max - min))) + Graymatrix[i, j] > 255)
            fouriermatrix[i, j] = 255; //過大給予數值

int Width = iImage.GetWidth(src);
int Height = iImage.GetHeight(src);

byte[,] imagematrix = new byte[Height, Width];
byte[,] imagematrix_af = new byte[Height, Width];
double[,] temp = new double[Height, Width];
err = iImage.iPointerFromImage(Image, ref imagematrix[0, 0], Width, Height);
print_error(err);
double number = 0;
int c = 1;
for (int i = 0; i < Height; i++)
{
    for (int j = 0; j < Width; j++)
    {
        number = 0;

        if (i - 1 >= 0 && i + 1 < Height && j - 1 >= 0 && j + 1 < Width)
        {
            number = imagematrix[i + 1, j] + imagematrix[i, j + 1] + imagematrix[i - 1, j] + imagematrix[i, j - 1];
            temp[i, j] = imagematrix[i, j] + c * Math.Pow(number, 2);
        }
    }
}

double min = 100;
double max = 0;
for (int i = 0; i < Height; i++)
    for (int j = 0; j < Width; j++)
    {
        if (temp[i, j] > 0)
            temp[i, j] = temp[i, j] + 0.5; //進位
        else
            temp[i, j] = 0;
        if (temp[i, j] > max) //紀錄大小(歸一化用)
            max = temp[i, j];
        else if (temp[i, j] < min) //紀錄大小(歸一化用)
            min = temp[i, j];
    }

for (int i = 0; i < Height; i++)
    for (int j = 0; j < Width; j++)
    {
        imagematrix_af[i, j] = (byte)((temp[i, j] - min) * (255 / (max - min))) + imagematrix[i, j]; //歸一化最大值255追加原本的圖
        if (((temp[i, j] - min) * (255 / (max - min))) + imagematrix[i, j] > 255)
            imagematrix_af[i, j] = 255;
    }
}

```

3. (40%) Homomorphic filtering:

- (1) Design the Homomorphic filter, then apply to Fig. 4.60 (4th global edition) and your own image having illumination variations. Show your best output image and the corresponding tuning parameters.

- (2) Enhance the original image by histogram equalization and compare the result with
(1). Which one do you feel better? Explain why?



左圖第一張為原始圖，中間為 Homomorphic filter，右邊為 histogram equalization。

```

for (int i = 0; i < padding_height * 2; i++)
{
    for (int j = 0; j < padding_width * 2; j++)
    {
        if (big_matrix[i, j].Re > 0)
        {
            big_matrix[i, j].Re = Math.Log(big_matrix[i, j].Re + 1, Math.E);
        }
    }

    double min_value = 255; //歸一化
    double max_value = 0;
    for (int i = 0; i < Height; i++)           // i index for cols ( 0-Hight-1)(Because that matrix index is start from 0)
    {
        for (int j = 0; j < Width; j++)         // j index for rows ( 0-Width-1)
        {
            if (padding_matrix[i, j] > max_value)
            {
                max_value = padding_matrix[i, j];
            }
            if (padding_matrix[i, j] < min_value)
            {
                min_value = padding_matrix[i, j];
            }
        }
    }

    for (int i = 0; i < padding_height * 2; i++)
    {
        for (int j = 0; j < padding_width * 2; j++)
        {
            if (i < padding_height && j < padding_width)
            {
                padding_matrix[i, j] = (padding_matrix[i, j] - min_value) / (max_value - min_value);
                big_matrix[i, j].Re = Math.Pow(-1, i + j) * padding_matrix[i, j]; //(-1)^(x+y) 轉置
            }
            else
            {
                big_matrix[i, j].Re = 0;
            }
        }
    }
}

AForge.Math.FourierTransform.FFT2(big_matrix, AForge.Math.FourierTransform.Direction.Forward); //fft傅立葉轉換
for (int i = 0; i < padding_height * 2; i++)
{
    for (int j = 0; j < padding_width * 2; j++)
    {
        big_matrix[i, j].Re = big_matrix[i, j].Re * ((rh_value - rl_value) *
        (1 - Math.Exp(-1 * c_value * (Math.Pow(i - Height / 2, 2) + Math.Pow(j - Width / 2, 2)) / (2 * d0_value * d0_value))) + rl_value);
        big_matrix[i, j].Im = big_matrix[i, j].Im * ((rh_value - rl_value) *
        (1 - Math.Exp(-1 * c_value * (Math.Pow(i - Height / 2, 2) + Math.Pow(j - Width / 2, 2)) / (2 * d0_value * d0_value))) + rl_value);
    }
}
AForge.Math.FourierTransform.IFFT2(big_matrix, AForge.Math.FourierTransform.Direction.Backward); //ifft轉換

```

```

        for (int i = 0; i < padding_height * 2; i++)
    {
        for (int j = 0; j < padding_width * 2; j++)
        {
            if (big_matrix[i, j].Re > 0)
            {
                big_matrix[i, j].Re = Math.Exp(big_matrix[i, j].Re);
            }
        }
    }

    min_value = 255; //歸一化
    max_value = 0;
    for (int i = 0; i < padding_height * 2; i++)
    {
        for (int j = 0; j < padding_width * 2; j++)
        {
            if (big_matrix[i, j].Re > 0)
            {
                big_matrix[i, j].Re = (int)Math.Ceiling(big_matrix[i, j].Re);
            }
            else
            {
                big_matrix[i, j].Re = 0;
            }
            if (big_matrix[i, j].Re > max_value)
            {
                max_value = big_matrix[i, j].Re;
            }
            if (big_matrix[i, j].Re < min_value)
            {
                max_value = big_matrix[i, j].Re;
            }
            if (big_matrix[i, j].Re < min_value)
            {
                min_value = big_matrix[i, j].Re;
            }
        }
    }

    byte[,] Graymatrix_af = new byte[Height, Width];
    AForge.Math.Complex[,] big_matrix_af = new AForge.Math.Complex[padding_height * 2, padding_width * 2];
    for (int i = 0; i < padding_height * 2; i++)
    {
        for (int j = 0; j < padding_width * 2; j++)
        {
            big_matrix_af[i, j].Re = big_matrix[i, j].Re * Math.Pow(-1, i + j);
        }
    }

    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            Graymatrix_af[i, j] = (byte)((big_matrix_af[i, j].Re - min_value) / (max_value - min_value) * 255 + Graymatrix[i, j]);
            if ((big_matrix_af[i, j].Re - min_value) / (max_value - min_value) * 255 + Graymatrix[i, j] > 255)
            {
                Graymatrix_af[i, j] = 255;
            }
        }
    }
}

```

```

public void His( IntPtr src, IntPtr src2, PictureBox pictureBox)
{
    int Width = iImage.GetWidth(src);           // Get image width
    int Height = iImage.GetHeight(src);          // Get image height
    byte[,] Graymatrix = new byte[Height, Width];
    byte[,] Graymatrix_his = new byte[Height, Width];
    int[] gray_level = new int[256];
    for (int i = 0; i < gray_level.Length; i++)
    {
        gray_level[i] = i;
    }
    int[] gray_org_count = new int[256];
    double[] gray_org_pr = new double[256];
    double[] gray_af_pr = new double[256];

    err = iImage.iPointerFromImage(src, ref Graymatrix[0, 0], Width, Height);
    print_error(err);
    for (int i = 0; i < Height; i++)//統計每個灰階值出現次數
    {
        for (int j = 0; j < Width; j++)
        {
            gray_org_count[Graymatrix[i, j]] = gray_org_count[Graymatrix[i, j]] + 1;
        }
    }
    for (int i = 0; i < gray_level.Length; i++)//算出各個灰階值的 PDF
    {
        gray_org_pr[i] = gray_org_count[i] / (double)(Width * Height);
    }
    for (int i = 0; i < gray_level.Length; i++)//算出各個灰階值的 PDF
    {
        gray_org_pr[i] = gray_org_count[i] / (double)(Width * Height);
    }
    for (int i = 0; i < 256; i++) //將PDF 做累加求出 CDF
    {
        for (int j = 0; j <= i; j++)
        {
            gray_af_pr[i] = gray_af_pr[i] + gray_org_pr[j];
        }
    }
    for (int i = 0; i < Height; i++)
    {
        for (int j = 0; j < Width; j++)
        {
            Graymatrix_his[i, j] = (Byte)(gray_af_pr[Graymatrix[i, j]] * 255);
        }
    }
}

```

Homomorphic filter 的結果比較好，因為其對比度比較明顯。