

## Lab 6 IPT 2022-2023

### Applications of the wavelet transform for image filtering

#### 1. Introduction

Wavelet transformed image filtering techniques separate for each high-frequency sub-band -  $I(x, y)$  – the components due to useful signal  $I_s(x, y)$  from those due to noise  $I_{zg}(x, y)$

$$I(x, y) = I(\lambda) = \{I_s(x, y)\} \cup \{I_{zg}(x, y)\} \quad (1)$$

According to the wavelet formalism all detail coefficients associated with a DWT decomposition with all detail coefficients in absolute value to a threshold  $\lambda$  are considered as a useful signal -  $I_s(x, y)$  - and all other coefficients of detail are considered to come from noise  $I_{zg}(x, y)$ .

DWT-based *hard* image filtering techniques involve the cancellation of all noise coefficients and the retention of all the other coefficients from the useful signal.

Wavelet-based image filtering algorithms use some predefined steps:

- noise level estimation;
- estimation of the separation threshold between the two classes of coefficients  $\lambda$ .

The most used techniques, *VisuShrink* and *BayesShrink* start from the frequency band  $HH...H$  and estimate the noise level using the *Mean Absolute Deviation (MAD)* defined by:

$$MAD = \frac{\text{mediana}(|I_{HH}|)}{0.6745} \quad (2)$$

The separation threshold in the *VisuShrink* model is estimated on the basis of the following equation:

$$\lambda = MAD \cdot \sqrt{2 \lg N_{SB}} \quad (3)$$

with  $N_{SB}$  the total number of detail coefficients in the considered subband.

Even if the threshold is estimated only from this frequency band, *VisuShrink* wavelet filtration involves its use in comparisons in all frequency subbands – except  $LLL...L$ . This threshold is recalculated for each level of decomposition to which the filtration operation applies.

The purpose of the lab consists in the study and implementation of a *VisuShrink* filtering method and its comparison with other types of classical image filtering methods.

#### 2. *VisuShrink* algorithm implementation in *VisualDSP ++*

The skeleton of the application that will be used to implement the *VisuShrink* algorithm corresponds to an implementation of the direct and inverse DWT transforms through Haar filter banks. The *Visual DSP++* project available on the discipline website includes all the necessary functions:

*float Estimare\_prag(float \* intrare, float \* hh, int latime, int inaltime)* - function that allows the comparison threshold computation according to the formulas (2) și (3)

*void sortare(float \* valori, long numar\_el)* – function that allows you sorting list of values of a certain length in descending order – both transmitted as parameters in the function call  
*void comparare\_prag(double \* intrare, int lim\_jos\_x ,int lim\_sus\_x,int lim\_jos\_y,int lim\_sus\_y , double prag)* – function that allows comparing the values of a region in an image with a threshold. The region to be analysed is specified by the limits on x and y called suggestively *lim\_jos(sus)\_x(y)*.

### 3. Exercises

- 1) Analyze how the above functions are implemented (appendix 1).
- 2) Modify the project *Filtrare\_wavelet* for allowing VisuShrink-based filtering of an image
- 3) Using the results from 2, process the image **lena\_zg.bmp**; analyse the obtained results and indicate what is the effect of wavelet filtering on detail coefficients . Save the result obtained in the current directory under the name **lena\_wavelet.bmp**. Which are the values corresponding to 2 and 3?
- 4) Repeat 3) and filter the **lena\_wavelet.bmp**. Which is the effect observable on the output image?
- 5) Change the comparison condition *if (fabs(intrare [i+j\*dimx])<prag)*  
with *if (fabs(intrare [i+j\*dimx])>0)*  
Run the app and explain the effect of the new condition by analysing the effects on the image obtained.
- 6) Propose implementations in another VisualDSP project for a mean and median filter (N=25). Process the same image from point 3 and compare the obtained results
- 7) Outline the changes to be made to the project *Filtrare\_wavelet* in order to allow the algorithm to be applied on multiple levels.

### Bibliografie

[1] R. Terebes – Tehnologii de prelucrare a informației – notițe de curs 2022-2023, <http://ares.utcluj.ro/tpi>

**Appendix 1. Functions used in the implementation of the VisuShrink algorithm**

```
float Estimare_prag(float* intrare, float * hh_abs, int latime, int inaltime)
{
    float val_ret;
    long i,j;

    for (i=latime/2;i<latime;i++)
        for (j=inaltime/2;j<inaltime;j++)
        {
            if (intrare[i+j*latime]<0)
                hh_abs[i-latime/2+(j-inaltime/2)*latime/2]=-intrare[i+j*latime];
            else
                hh_abs[i-latime/2+(j-inaltime/2)*latime/2]=intrare[i+j*latime];
        }

    sortare(hh_abs, latime*inaltime/4-1);

    val_ret=hh_abs[latime*inaltime/8-1]/0.6745;
    val_ret=val_ret*sqrt(2*log10(inaltime*latime/4));

return val_ret;
}

void sortare(float * valori, int numar_el)
{
    int i,j;
    double curent;
    for (i=0;i<numar_el;i++)
    {
        curent=valori[i];
        j=i-1;
        while (j>=0 && curent>valori[j])
        {
            valori[j+1]= valori[j];
            j=j-1;
        }
        valori[j+1]=curent;
    }
}

void comparare_prag(float * intrare, int lim_jos_x ,int lim_sus_x,int lim_jos_y,int lim_sus_y ,
int dimx, int dimy, float prag)
{
    int i,j;
    for (i=lim_jos_x;i<lim_sus_x;i++)
        for (j=lim_jos_y;j<lim_sus_y;j++)
            if (fabs(intrare [i+j*dimx])<prag)
                intrare[i+j*dimx]=0.0;
}
}
```