# Signals and Systems in Bioengineering

Master on Biomedical Engineering

1st Semester 2020/2021

## Filtering

Lab Session 4

### João Miguel Sanches

Bioengineering Department (DBE) Instituto Superior Técnico / University of Lisbon

In this work two types of filters, one linear and other non linear, will be used to attenuate or, if possible, to remove two types of noise corrupting audio and image data; *Additive white Gaussian Noise* (AWGN) and *salt and pepper Noise* (SPN).

In the first part the SPN is used to simulate the traditional noise present in the old vinyl long play records. This type of noise, non additive nor Gaussian, is characterized by maximum and minimum saturated samples at random instants. Removing of this type of noise using linear filtering is usually not efficient. Conversely, non linear filtering is usually quite efficient when dealing with this type of non-linear degradation process, e.g., the **median** filter.

The output of a basic 1D median filter is the median value of the set of values composed by the intensities of the pixels in the neighborhood of the current sample plus the current sample, that is, the median of the pixel set contained in the 2M + 1 dimension neighboring window. In this strategy the noisy pixels tend to accumulate at the extrema of the window which leads to its elimination.

#### I. 1D FILTERING

1) Develop a routine to implement the equation of differences corresponding to the following filter

$$H(z) = \frac{b_0 + b_1 z^{-1} + \dots + b_M z^{-M}}{1 + a_1 x^{-1} + \dots + a_N z^{-N}}.$$
 (1)

The routine should be called with the following command: y = filtro(x, A, B); where  $A = [1, a_1, ..., a_N]^T$ ,  $B = [b_0, b_1, ..., b_M]^T$ , y is the output signal and x is the input signal.

- 2) Design a 10 order Butterworth filter with a cut-off frequency equal to  $\pi/2$  by using the function butter(). Visualize it frequency response by using the function freqz() and the pole localization using the function roots() (read carefully the help documentation of these functions).
- 3) For each audio file provided, *fungeesAWGN.wav* corrupted by AWGN and *fuggesSaltPeper.wav* corrupted by SPN, make the following
  - a) Read the audio file, listen it and represent it graphically.
  - b) Can you identify, in the plot, the noise corrupting the music (you can read the original file, *fugges.wav* for comparison purposes)?
  - c) Use the routine implemented in question 2) to filter the signal/music with the filter designed in question 3). Comment the results, namely concerning the quality of the audio output signal.
  - d) Filter now the audio signal with the median filter, by using the following command: y = medfilt(x, N); where N = 3 is the window dimension. Listen the result and compare it with the one obtained with the linear filter.
  - e) Try other dimensions of the median filter to improve the results. Comment the results as function of the window dimension of the median filter.
  - f) Comment the results, namely, the effectiveness of each type of the filter as function of the type of noise corrupting the data.

1

#### II. 2D FILTERING

- 1) Load the image *len\_gray.jpg* and corrupt it with salt and pepper noise for different amounts of noise (use the MatLab command *imnoise*). Visualize the noisy image with the *imagesc* and *mesh* functions. Comment.
- 2) Filter the image by convolving it (use the MatLab function *conv2*) with a Gaussian mask (use the MatLab function *window* to generate the mask) for different values of the parameters of the window. Comment the result with respect to the effectiveness of noise removal.
- 3) Filter the image using a 2D median filter (use the MatLab function *medfilt2*) and compare the results with the one obtained in the previous item. Test with several values of the parameters. Comment.
- 4) Convolve the original image  $len\_gray.jpg$ ,  $\mathbf{f} = \{f_{i,j}\}$ , with the following 2D masks (use the MatLab function conv2)

$$G_x = \begin{bmatrix} -1 & 0 & 1 \\ -2 & 0 & 2 \\ -1 & 0 & 1 \end{bmatrix} \qquad G_y = \begin{bmatrix} 1 & 2 & 1 \\ 0 & 0 & 0 \\ -1 & -2 & -1 \end{bmatrix}$$
 (2)

and compute the image

$$g_{i,j} = \sqrt{(G_x * \mathbf{f})_{i,j}^2 + (G_y * \mathbf{f})_{i,j}^2}.$$
 (3)

- 5) The previous filter is called *Sobel* operator. What type is this filter? Why? Comment?
- 6) Convolve the original image with the Laplacian operator with the following masks

$$\mathcal{L}_4 = \begin{bmatrix} 0 & -1 & 0 \\ -1 & 4 & -1 \\ 0 & -1 & 0 \end{bmatrix} \qquad \mathcal{L}_8 = \begin{bmatrix} -1 & -1 & -1 \\ -1 & 8 & -1 \\ -1 & -1 & -1 \end{bmatrix} \tag{4}$$

and visualize the results. Explain how it works. What type of filter are these two Laplacian operators.

- 7) Use the *MatLab* function *edge* with parameters 'sobel' and 'canny' with the same image. Comment and compare the results and correlate them with the ones obtained in the 4) and 6).
- 8) Derive the difference equations that represent the *Laplacian* operators  $\mathcal{L}_4$  and  $\mathcal{L}_8$ .