



Politechnika Łódzka  
Instytut Elektroniki

# **SIGNAL PROCESSING**

Laboratory #6:

## **Signal filtering in Python**

*M. Kociński, P. Strumiłło*

Medical Electronics Division  
Institute of Electronics

**PURPOSE:**

Getting acquainted with basic properties of *Finite Impulse Response* (FIR) filters and *Infinite Impulse Response* (IIR) filters, their design in Python environment and their practical applications.

**TASKS:**Introduction:

Difference equation of a digital causal filter is given by:

$$\sum_{k=0}^M b(k)x(n-k) = \sum_{k=0}^N a(k)y(n-k)$$

which is equivalent to a difference equation:

$$a[0]y[n] = -a[1]y[n-1] - a[2]y[n-2] - \dots - a[N]y[n-N] + b[0]x[n] + \dots + b[M]x[n-M]$$

where:

- $a[k]$  – autoregressive filter coefficients,
- $b[k]$  – moving average filter coefficients.

For the FIR filters all the autoregressive coefficients are zero except  $a[0]=1$ .

Justify the names for  $a[k]$  and  $b[k]$  coefficients.

TASK 1:

Write difference equations and block diagrams of the following filters (by default we assume  $a[0]=1$ , if  $a[0] \neq 1$  we need to divide all coefficients values by  $a[0] \neq 0$ ):

- $b[0]=4, b[1]=2$ ,
- $b[0]=2, a[1]=0.5$
- $b[0]=0.5, a[3]=1$
- $b[0]=1, b[1]=2, a[1]=0.5, a[3]=1$

**I. FIR filters**Pros:

- available simple, linear methods for designing filters,
- linear phase can be easily achieved (symmetry of coefficients),
- are always stable,
- feature short transient states (finite impulse response),

Cons:

- a high number of filter coefficients are required (i.e. high filter order) to obtain steep frequency characteristics.

**TASK 2:**

A FIR filter is given  $b[0]=0.5$ ,  $b[1]=0.5$ . Write a script showing that impulse response of this filter is equal to its moving average coefficients.

*hint:* define signal  $x=[1, 0, 0, \dots, 0]$  of length  $N=100$  sample at a frequency rate  $f_s=11400$  Hz, and use the *lfilter* function from *scipy.signal* package to obtain the impulse response.

**TASK 3:**

Compute frequency characteristic of the filter defined in Task 2 by using the two following methods:

- 1) by computing the Fourier transform of the impulse response obtained in Task 2; plot the amplitude and phase spectrum of the filter
- 2) by using the *freqz* command from the *scipy.signal* package  
What kind of filter frequency characteristic you have obtained?  
Is the phase linear? What is the practical consequence of phase linearity?
- 3) From within the Python environment play the *voice\_noise.wav* wave file (see lab. 3). From the lecture signal database load the wave file *voice\_noise.wav* into the Python workspace (the signal is sampled with a rate of  $f_s=11.4$  kHz. Filter the voice signal using the filter from Task 2. Store the filtering result in file *voice\_filtered.wav*. Finally, play the *voice\_filtered.wav* wave file

**TASK 4:**

Repeat Task 2 for the FIR filter with coefficients  $b[0]=0.5$ ,  $b[1]=-0.5$

**TASK 5:**

Compute an impulse response of a filter which is a cascade connection of the filters studied in Task 2 and Task 4. What is the frequency characteristic of this combined filter.

**II. IIR filters****Pros:**

- steep frequency characteristics can be achieved for low filter orders.

**Cons:**

- difficulty in keeping the filter phase linear,
- can be unstable.

**Task 6:**

There is an IIR filter given:

$$y(n) = x(n) - \alpha y(n-1)$$

where:  $\alpha$  - is a parameter.

Write a function plotting impulse response of the filter for different values of parameter  $\alpha$ .

What is the impulse response for parameter's values:

$$\alpha = 0.9, \alpha = -0.9, \alpha = 1.1, \alpha = -1.1, \alpha = 1$$

Comment the obtain results. What is the range of values for parameter  $\alpha$  giving a stable filter?

TASK 7:

Load into the Pylab environment an audio signal *male\_voice.wav* sampled at a rate of  $f_s=11.4$  kHz. Use the following IIR filter coefficients  $b[0]=1$ ,  $a[0]=1$ ,  $a[1000]=-0.7$  to filter this signal. Save the result in a wave file. Play the file and comment the obtained audio effect.

TASK 8:

Go to [scipy.signal](http://docs.scipy.org/doc/scipy/reference/signal.html) reference guide available from the webpage:  
<http://docs.scipy.org/doc/scipy/reference/signal.html>

and find the *Filter design* section. Then select the *firwin* function for designing finite impulse response filter for specified frequency characteristics, e.g. the command  $b=firwin(40,0.7)$  will compute  $M=40$  autoregressive filter coefficients defining a low-pass filter with a cut-off frequency at  $f_c=0.7*(f_s/2)$ . Use *freqz* command to plot the frequency characteristic of this filter.

Follow the examples in the *scipy.signal.firwin* section and define: high-pass, band-pass and band-stop filters. Plot frequency characteristics of these filters.

□ 1/12/2012