



Digital Signal Processing I

4th Week EXPERIMENT

Report

(2nd report of DSP1 course)

Subject	Digital Signal Processing I
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-Contents-

I . Abstraction

1. Convolution

1-1. Definition of Convolution

1-2. Visual explanation of convolution

1-3. Matlab implementation of convolution

2. Correlation

2-1. Definition of Correlation

2-2. Convolution, correlation, autocorrelation

II. Exercises

1. Matlab codes of each exercise

2. Results

I . Abstraction

1. Convolution

1-1. Definition of Convolution

Suppose there is an linear time-invariant system. $h(n)$ is the impulse response. For an signal $x(n)$, convolution is defined as:

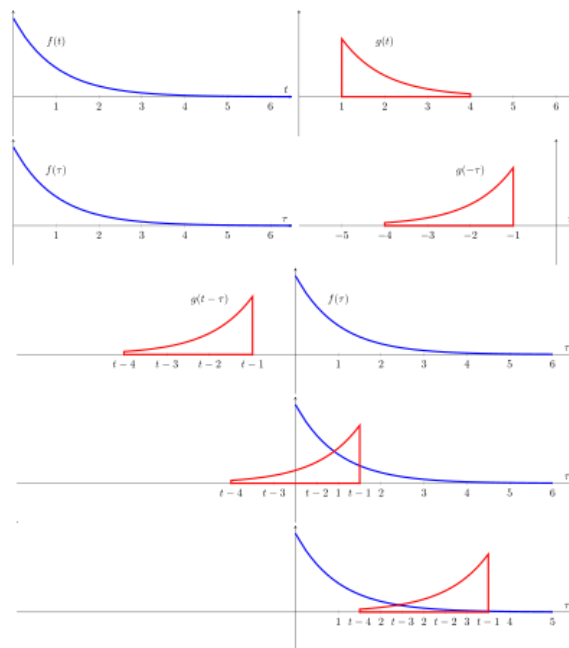
$$y(n) = \sum_{k=-\infty}^{\infty} x[k]h[n-k] = \sum_{k=-\infty}^{\infty} x[n-k]h[k]$$

And it is denoted by:

$$y(n) = x(n) * h(n)$$

1-2. Visual explanation of convolution

Convolution can be represented visually by fixing one signals, and shifting flipped other signal. This image¹ shows detailed process of convolution.



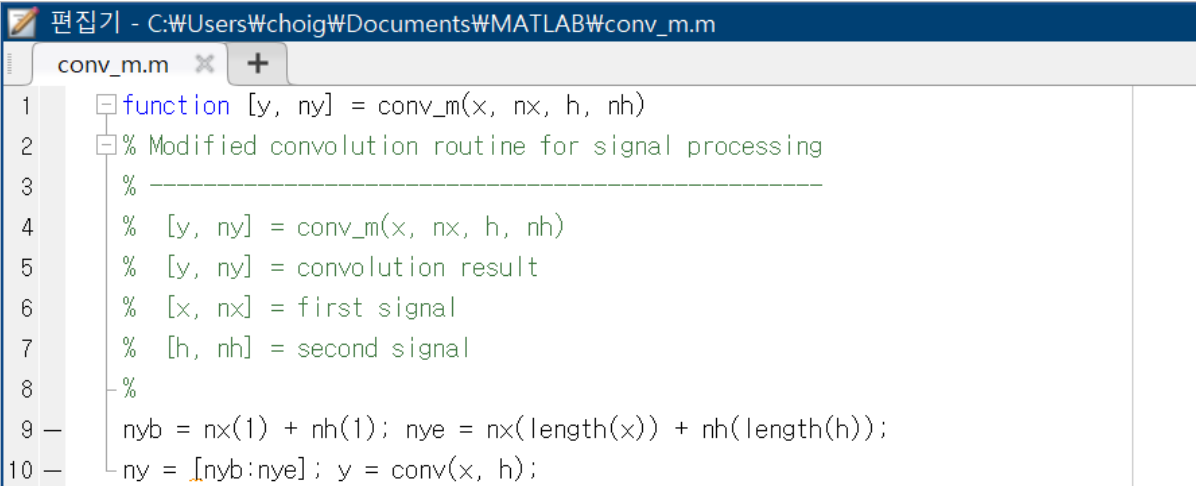
¹ <https://en.wikipedia.org/w/index.php?title=Convolution&oldid=888199331>

- Select one signal from original two signals
- Flip the selected signal
- Slide from $t = -\infty$ to $t = \infty$

The selection of one signal doesn't change the convolution result.

1-3. Matlab implementation of convolution

The following code represents the implementation of convolution with Matlab.



```
1 function [y, ny] = conv_m(x, nx, h, nh)
2 % Modified convolution routine for signal processing
3 % -----
4 % [y, ny] = conv_m(x, nx, h, nh)
5 % [y, ny] = convolution result
6 % [x, nx] = first signal
7 % [h, nh] = second signal
8 %
9 nyb = nx(1) + nh(1); nye = nx(length(x)) + nh(length(h));
10 ny = [nyb:nye]; y = conv(x, h);
```

2. Correlation

2-1. Definition of Correlation

Correlation is an operation used in many applications in digital signal processing. It is a measure of the degree to which two sequences are similar.

$$y_{xh}(n) = \sum_{k=-\infty}^{\infty} x[k]h[k-n] = \sum_{k=-\infty}^{\infty} x[k]h[-(n-k)] = x[n] * h[-n]$$

Correlations are useful because they can indicate a predictive relationship that can be explained in practice.² For example, an electrical utility may produce less power on a mild day based on the correlation between electricity demand and weather. In this example, there is a causal relationship, because extreme weather causes people to use more electricity for heating or cooling.

However, in general, the presence of a correlation is not sufficient to infer the presence of a causal relationship.

Correlation between two random variable X and Y with expected values μ_x and μ_y and standard deviations σ_x and σ_y is defined by:

$$\sigma_{X,Y} = \text{corr}(X,Y) = \frac{\text{cov}(X,Y)}{\sigma_x \sigma_y} = \frac{E[(X - \mu_x)(Y - \mu_y)]}{\sigma_x \sigma_y}$$

* $\text{cov}(X, Y)$: covariance(공분산)

2-2. Convolution, correlation, autocorrelation

1) Convolution

$$y[n] = \sum_{k=-\infty}^{\infty} x[k]h[n-k] = x[n] * h[n]$$

² https://en.wikipedia.org/wiki/Correlation_and_dependence#Definition

2) Correlation

$$r_{xh}[n] = \sum_{k=-\infty}^{\infty} x[k]h[k-n] = \sum_{k=-\infty}^{\infty} x[k]h[-(n-k)] = x[n] * h[-n]$$

3) Autocorrelation

$$r_{xx}[n] = \sum_{k=-\infty}^{\infty} x[k]x[k-n] = x[n] * x[-n]$$

II. Exercises

In this part, there are 2 exercise questions. Each exercise consists of code and its result. All documents including Matlab code, result, and this report are uploaded in this website :

https://github.com/Gaon-Choi/ELE3076/tree/main/2_convolution

Example 2.8

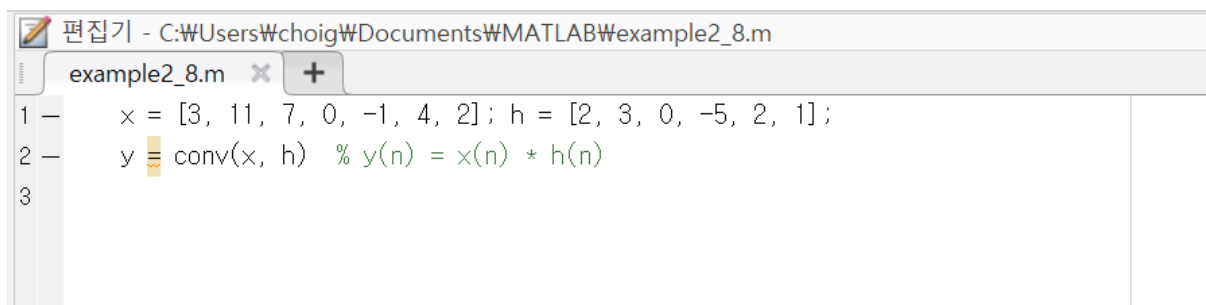
Given the following two sequences,

$$x(n) = [3, 11, 7, 0, -1, 4, 2] \quad -3 \leq n \leq 3;$$

$$h(n) = [2, 3, 0, -5, 2, 1] \quad -1 \leq n \leq 4;$$

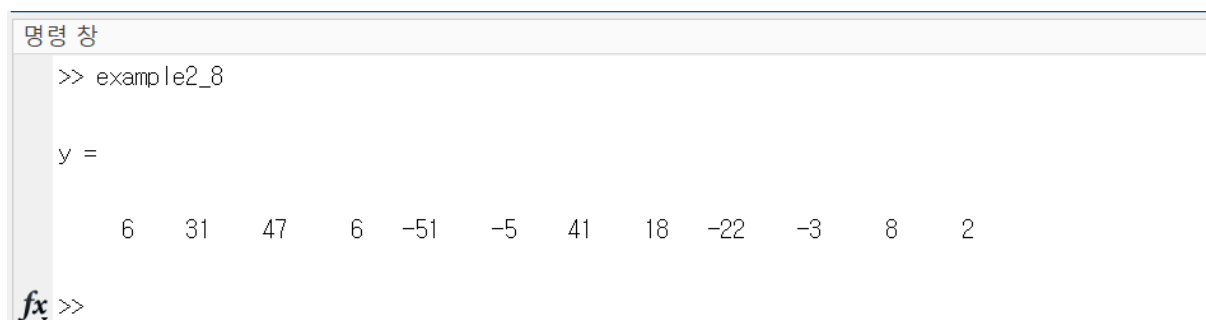
determine the convolution $y(n) = x(n) * h(n)$.

(Matlab code)



```
편집기 - C:\Users\Wchoig\Documents\MATLAB\example2_8.m
example2_8.m x +
1 - x = [3, 11, 7, 0, -1, 4, 2]; h = [2, 3, 0, -5, 2, 1];
2 - y = conv(x, h) % y(n) = x(n) * h(n)
3
```

(Result)



```
명령 창
>> example2_8

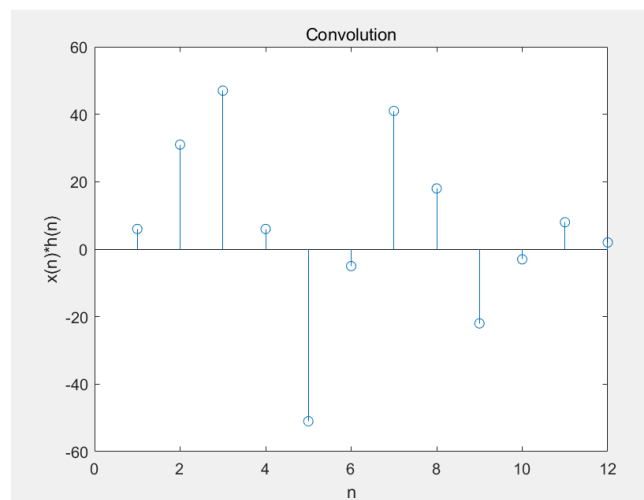
y =

    6    31    47     6   -51    -5    41    18   -22    -3     8     2

fx >>
```

Additionally, $y(n)$ can be plotted with "stem()" function in Matlab basic function. The following shows the code and its result.

```
편집기 - C:\Users\Wchoig\Documents\MATLAB\example2_8.m
example2_8.m
1 — x = [3, 11, 7, 0, -1, 4, 2]; h = [2, 3, 0, -5, 2, 1];
2 — y = conv(x, h); % y(n) = x(n) * h(n)
3 — subplot(1, 1, 1);
4 — stem(y);
5 — title("Convolution")
6 — xlabel('n'); ylabel('x(n)*h(n)');
```



Example 2.10

In this example we will demonstrate one application of the crosscorrelation sequence. Let

$$x(n) = [3, 11, 7, 0, -1, 4, 2]$$

be a prototype sequence, and let $y(n)$ be its noise-corrupted-and-shifted version

$$y(n) = x(n - 2) + w(n)$$

where $w(n)$ is Gaussian sequence with mean 0 and variance 1. Compute the crosscorrelation between $y(n)$ and $x(n)$.

(Matlab code)

```
% noise sequence 1
x = [3, 11, 7, 0, -1, 4, 2];
nx = [-3:3];                                % given signal x(n)

[y, ny] = sigshift(x, nx, 2);                % obtain x(n - 2)
w = randn(1, length(y)); nw = ny;           % generate w(n)

[y, ny] = sigadd(y, ny, w, nw);              % obtain y(n) = x(n - 2) + w(n)
[x, nx] = sigfold(x, nx);                    % obtain x(-n)

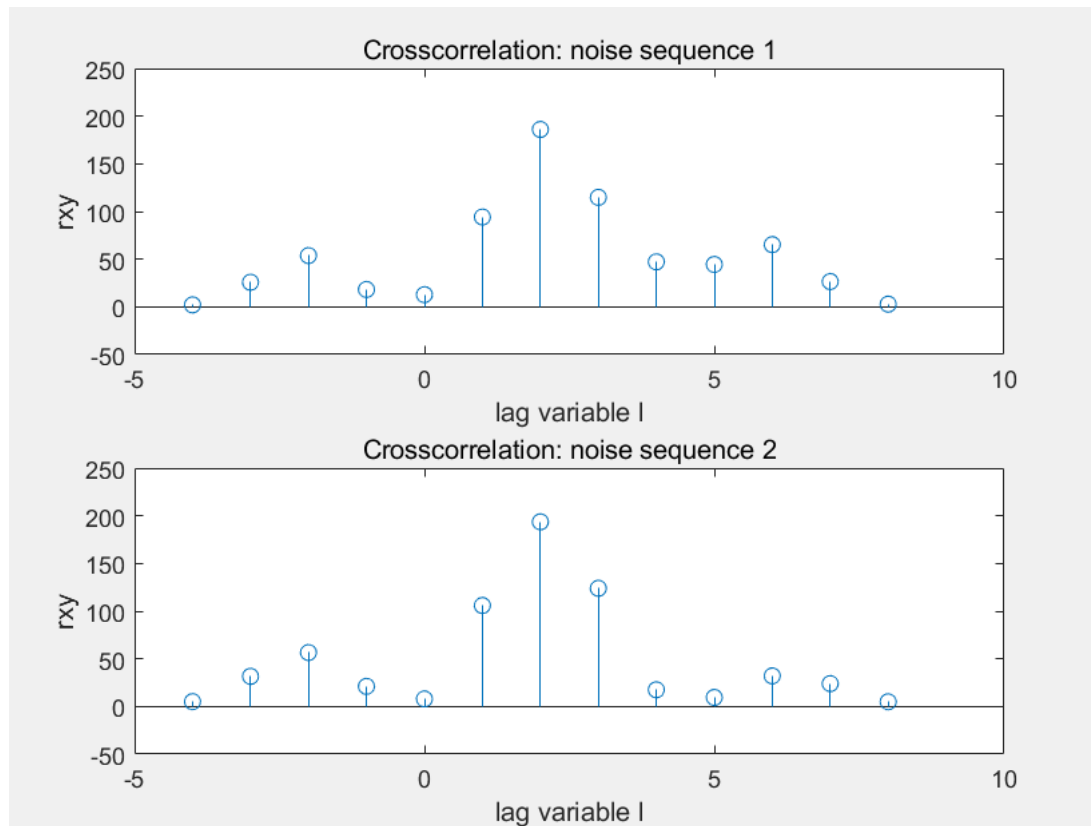
[rxy, nrxy] = conv_m(y, ny, x, nx);          % crosscorrelation
subplot(1, 1, 1), subplot(2, 1, 1); stem(nrxy, rxy)
axis([-5, 10, -50, 250]); xlabel('lag variable l')
ylabel('rxy'); title('Crosscorrelation: noise sequence 1')
%
% noise sequence 2
x = [3, 11, 7, 0, -1, 4, 2];
nx = [-3:3];                                % given signal x(n)

[y, ny] = sigshift(x, nx, 2);                % obtain x(n - 2)
w = randn(1, length(y)); nw = ny;           % generate w(n)

[y, ny] = sigadd(y, ny, w, nw);              % obtain y(n) = x(n - 2) + w(n)
[x, nx] = sigfold(x, nx);                    % obtain x(-n)

[rxy, nrxy] = conv_m(y, ny, x, nx);          % crosscorrelation
subplot(2, 1, 2); stem(nrxy, rxy)
axis([-5, 10, -50, 250]); xlabel('lag variable l')
ylabel('rxy'); title('Crosscorrelation: noise sequence 2')
```

(Result)



Two graph always shows different result, because they are produced with randn function. We observe that the cross-correlation peaks at $l=2$, which implies that $y[n]$ is similar to $x[n]$ shifted by 2.