

RANDOM SIGNALS

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# M2 AI — SIGNAL PROCESSING

# INTRODUCTION

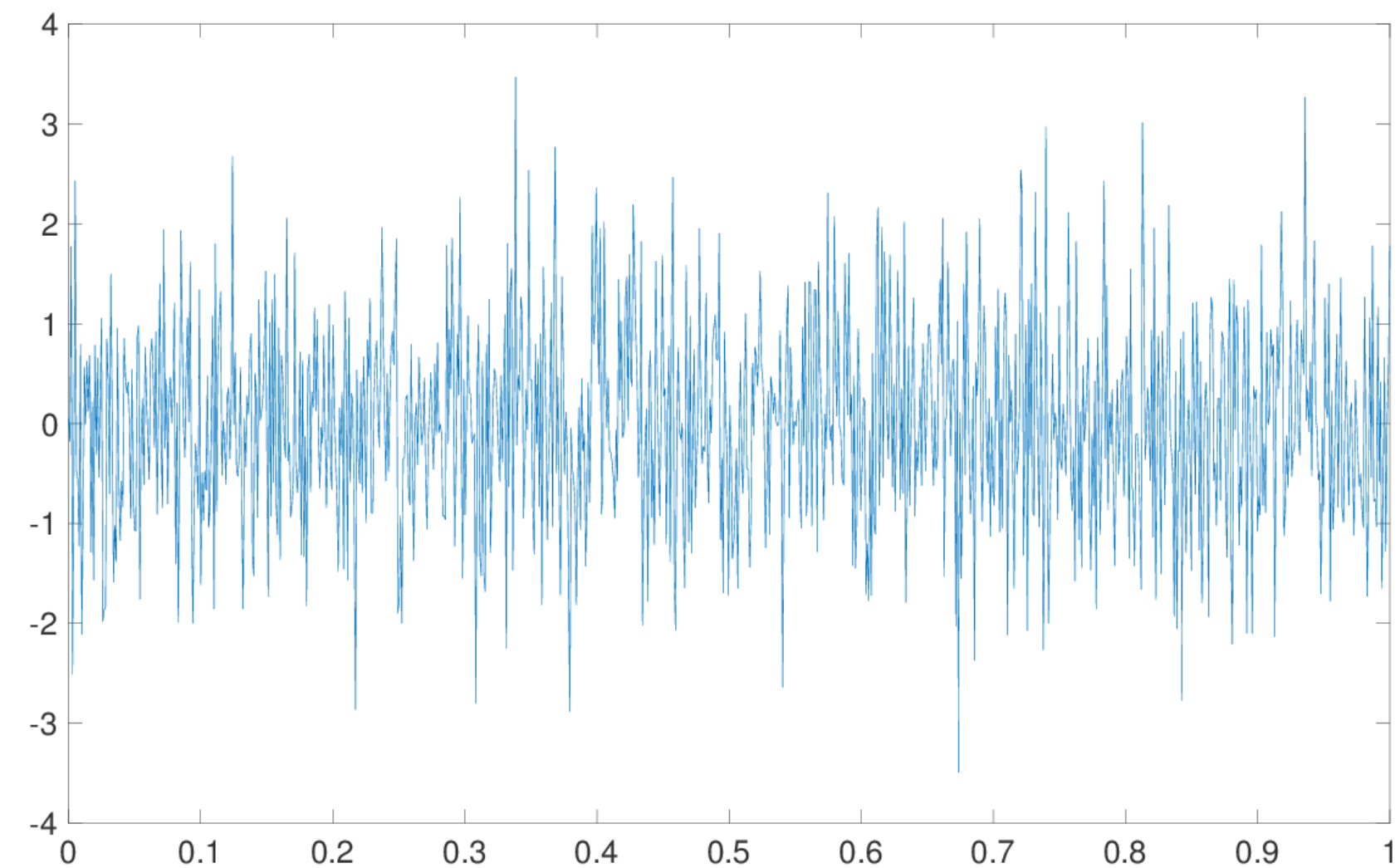
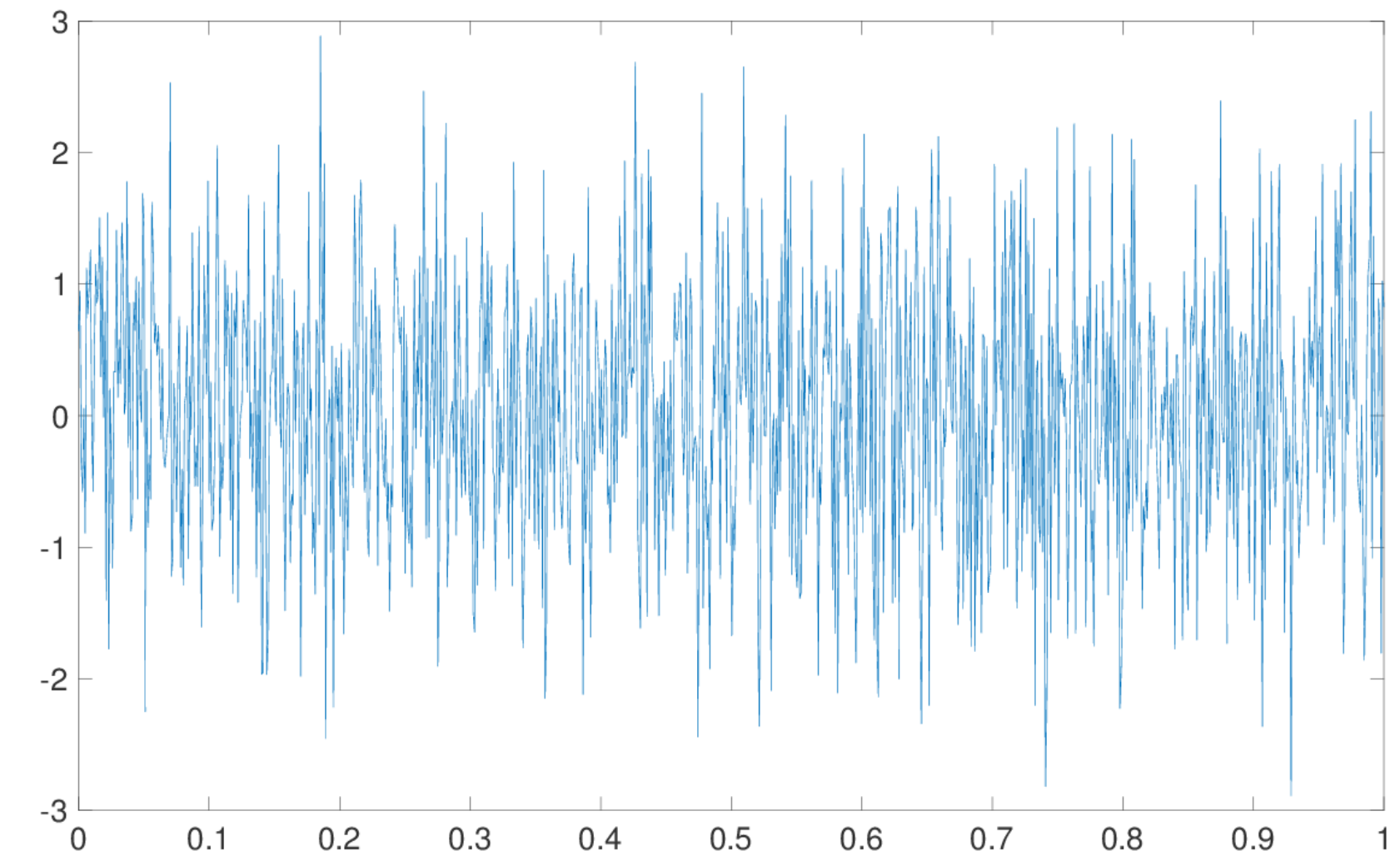
Usefulness:

Noise modeling

Statistical estimation

Bayesian approach

Different, but similar



# DIGITAL RANDOM SIGNAL

A digital random signal is a random process:  $\{X[n]\}$

For each  $n$ ,  $X[n]$  is a random variable

In practice we observe one (partial) trajectory, that is one realization  $\{x[n]\}$

The random signal is, usually, assumed to be ergodic and stationary:

- We can work with only one realization

- The autocorrelation function  $R_X[k]$  is deterministic

- We can work with temporal statistics

# SPECTRUM OF RANDOM SIGNAL

Let  $x(t)$  be a random signal

The Fourier transform of  $x(t)$  is not meaningful

The spectrum of a random signal is the Fourier transform of its autocorrelation function:

$$S_x(f)$$

Can be difficult to estimate in practice

Two estimators:

Periodogram estimator (power spectrum of the observed trajectory  $x(t)$ )

Welch estimator (average of short-time power spectrum)

# NOISE

Gaussian white noise

All the random variables  $x[n]$  are i.i.d. from  $x[n]$

Autocorrelation function:  $R_x[k]$

Spectrum:  $S_x(f)$

A Gaussian colored noise is a filtered white noise

# LINEAR DENOISING

Let  $\tilde{x}$  be a noisy measure of a "clean" signal  $x$  corrupted by some additive noise  $n$ :

$$\tilde{x} = x + n$$

Signal to Noise Ratio (SNR):

$$\text{SNR} = \frac{\sigma_x^2}{\sigma_n^2}$$

Goal: find the best (oracle) filter  $H$  such that  $\hat{x}$  is the best estimation of  $x$

Solution: Wiener filter, given in the frequency domain by

$$H = \frac{S_x}{S_x + S_n}$$

More on the numerical tour !! (See the linear image denoising tour)

# TO DO: NOISE SPECTRUM DENSITY ESTIMATION AND WIENER FILTERING

Data

3 noises

Audio file or image of your choice

Todo

For each noise

Estimate the spectrum density by periodogram and Welsh method

Identify the color of the noise (white, pink, red, mixture of noises...)

With the image or audio file

Simulate a noisy version of the signal with various SNR (0dB, 5 dB, 10 dB, 15 dB, 20 dB), using a Gaussian white noise

Denoise the signal using the Wiener filter