

SPECTRAL ANALYSIS

M2 AI — SIGNAL PROCESSING

USEFULNESS

- ▶ Spectral analysis: frequency content of a function
- ▶ Think about musical notes!
- ▶ Measure the similarity (correlation, angle) between pure (complex) sine and a signal
- ▶ Sines are eigen signals of time-invariant linear systems (filters)
- ▶ The definition depends on the mathematical model

ONE FORMULA TO RULE THEM ALL

- ▶ Let $s(t)$ be a signal (continuous, discrete, periodic...). Let $\epsilon_\nu(t)$ be the (continuous, discrete, periodic...) **complex sine** at the frequency ν , then

$$\hat{s}(\nu) = \langle s(t), \epsilon_\nu(t) \rangle$$

And

$$s(t) = \langle \hat{s}(\nu), \overline{\epsilon_\nu(t)} \rangle$$

With the appropriate inner product !

ANALOG FOURIER TRANSFORM

- ▶ Fourier transform

$$\hat{s}(\nu) = \int_{-\infty}^{+\infty} s(t)e^{-i2\pi\nu t} dt$$

- ▶ Inverse Fourier transform

$$s(t) = \int_{-\infty}^{+\infty} \hat{s}(\nu)e^{i2\pi\nu t} d\nu$$

DIGITAL FOURIER TRANSFORM

- ▶ Let a discrete finite sequence $s = \{s[0], \dots, s[N-1]\}$ (i.e., a digital signal).
- ▶ Fourier Transform:

$$\hat{s}[k] = \sum_{t=0}^{N-1} s[t] e^{-i\frac{2\pi kt}{N}}$$

- ▶ Inverse Fourier transform

$$s[t] = \frac{1}{N} \sum_{k=0}^{N-1} \hat{s}[k] e^{i\frac{2\pi kt}{N}}$$

- ▶ The signal $s[t]$ and its Fourier transform $\hat{s}[k]$ are considered as **N-periodic sequences!**

MAIN PROPERTIES

- ▶ Linearity
- ▶ Energy and inner product preservation (Plancherel-Parseval theorem)
- ▶ Translation in time becomes modulation in frequency
- ▶ Modulation in time becomes translation in frequency
- ▶ Time scale
- ▶ Derivation
- ▶ Hermitian symmetry for a real signal
- ▶ Convolution for digital signals of same size N , (using zero-padding if necessary)

$$\widehat{u * v}[k] = \hat{u}[k]\hat{v}[k]$$

the convolution is supposed to be **N-periodic!**

SPECTRUM

- ▶ Let s be a signal and \hat{s} its Fourier transform. The (power) spectrum of s is the (squared) modulus of \hat{s} :

$$\text{(Magnitude)Spectrum}(s) = \{ |\hat{s}[k]| \} \quad \text{PowerSpectrum}(s) = \{ |\hat{s}[k]|^2 \}$$

- ▶ If s is real-valued, then the spectrum is symmetrical with respect to the frequency 0

TO DO: GUITAR TUNER

▶ Data:

- ▶ single notes in wav files
- ▶ Guitar notes and corresponding frequencies:
 - ▶ **E1:** 329.63 Hz ; **B2:** 246.94 Hz ; **G3:** 196.00 Hz ; **D4:** 146.83 Hz ; **A5:** 110.00 Hz ; **E6:** 82.41 Hz
- ▶ Values of 1 cent for accuracy of each string: 0.15, 0.15, 0.15, 0.08, 0.08, 0.04 (see: http://zerocapcable.com/?page_id=225 and https://www.engineeringtoolbox.com/octave-bands-frequency-limits-d_1602.html)

▶ Goal

For each wav files:

- ▶ Perform a spectral analysis
- ▶ Automatically determine the played note with the accuracy in cent

TO DO: ZOOM IN IMAGES

▶ Data:

- ▶ Any image you want

▶ Goal:

For a given image:

- ▶ Perform a spectral analysis
- ▶ Resize the image to get a smaller image of half size
 - ▶ in the space domain by subsampling
 - ▶ by resizing in the Fourier domain
- ▶ Resize the image to get a bigger image of double size
 - ▶ by sinc interpolation (zero padding in the Fourier domain)
 - ▶ by linear interpolation in the space domain