

The Neural Code

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Problem Set 3

—Convolution—

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1. (Convolution as Filter) Let us numerically explore convolutions

$$y(t) = (\kappa * x)(t) = \int_{-\infty}^{\infty} ds \kappa(s) x(t - s)$$

- (a) Load the fluorescence trace `exampleCAtrace.npy` from a calcium imaging experiment and plot it with the appropriate time axis (sampling frequency is 20 Hz).
- (b) Let's now focus on a small snippet from sample 1000 to 2000, which contains three visible transients.
- (c) Convolve the snippet with a Gaussian kernel with $\sigma = 250$ ms and interpret its action.
- (d) Change σ and explore the effect.
- (e) Next generate a new kernel by multiplying the Gaussian kernel ($\sigma = 250$ ms) with $-\sin(2\pi t)$ and plot the convolution. Why is the convolution approximating a differentiation?
- (f) Construct a kernel that approximates a second derivative and verify.

2. (Image filters) Instead of convolving in time, one can also convolve in space:

$$Q(x, y) = (\kappa * P)(x, y) = \int_{-\infty}^{\infty} dx' \int_{-\infty}^{\infty} dy' \kappa(x', y') P(x - x', y - y')$$

If we consider $P(x, y)$ to reflect the intensity of an image at pixel (x, y) , the output Q is a filtered image.

- (a) Load the image `freiburg.jpeg` with `img=matplotlib.image.imread(...)`, average over the three color channels (`img = np.mean(np.array(img), axis=2)`) and plot (`matplotlib.pyplot.imshow`).
- (b) Generate a 2-d Gaussian kernel $\sigma = 5$ pixels (check out `numpy.mgrid`) and convolve the image (use `from scipy.signal import convolve2d`) to obtain a blurred image.
- (c) Next, write a function that implements a Gabor kernel

$$\kappa(\vec{x}) = \exp[-(\vec{x})^2/(2\sigma^2)] \cos(\vec{k} \cdot \vec{x} - \phi)$$

with $\vec{x} = (x, y)$ and plot it for $\sigma = 5$ pixels, varying values of ϕ and various vectors \vec{k} with $|\vec{k}| = 0.5$. You can obtain vector \vec{k} with constant length L via $\vec{k} = L(\cos \alpha, \sin \alpha)$.

- (d) Which value of ϕ approximates a spatial derivative (edge detector)?
- (e) Obtain spatial derivatives for varying directions \vec{k} with $|\vec{k}| = 0.5$.
- (f) Now change the length of the wave vector $|\vec{k}|$. What is the effect of $|\vec{k}|$ on the convolutions?