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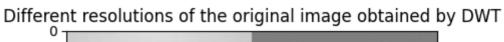
Project: Image Denoising (2nd part)

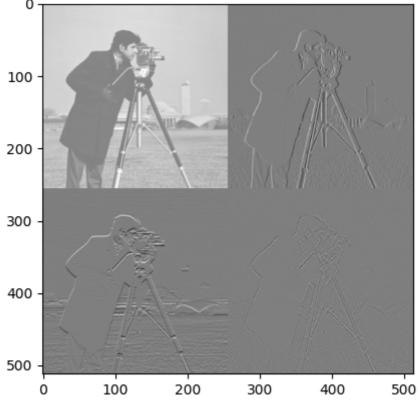
This project aims to use an orthonormal decomposition in 2D wavelets as operator L. This decomposition allows to have a view at several scales of the image. To do this we used the PyWavelets python package. Note: see part1.pdf for the answers of the first questions

1. Input image



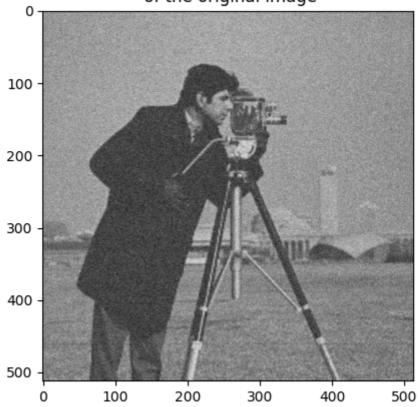
2. Image decomposition into multiple resolutions/levels using the discrete wavelet transform algorithm





3. Adding a Gaussian noise with mean=0 and standard deviation=30 to the original image.

Forward discrete wavelet transform (DWT) coefficients of the original image

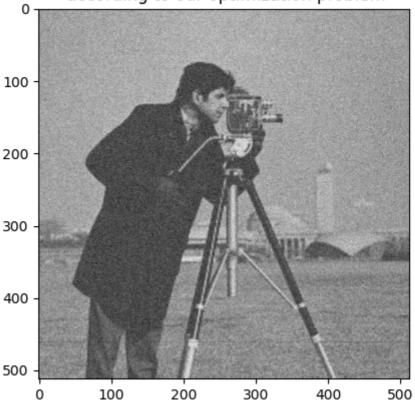


4. Decomposing the noised image into multiple resolutions/levels using the discrete wavelet transform algorithm



5. Denoising the image using wavelet transform:

Image reconstruction (x_hat) using inverse DWT on gaussian noised image according to our optimization problem



The discrete wavelet transform (DWT) of a given image returns the approximation, horizontal detail, vertical detail and diagonal detail coefficients. The DWT of the original image (Fig.1) returns coefficients with distinct shapes. When we add a Gaussian noise to the original image of mean=0 and sd =30, the DWT coefficients return a **less but still distinguishable shapes**. This difference is of course expected because of the noise added to the original image. This difference suggests DWT coefficients with more sparsity for the original image than those of the noised one which explain more distinguishable shapes on the different levels of decomposition of the original image compared to those of the noised image.

6. Finding the best learning rate (lambda) that returns the lowest mean square error (MSE) between the original image and the noised-denoised one.

