

MRA denoising

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Introduction



Introduction



Wavelet Transform (WT)

- wavelet

$$\psi_{a,b}(t) = \frac{1}{\sqrt{b}} \psi\left(\frac{t-a}{b}\right)$$

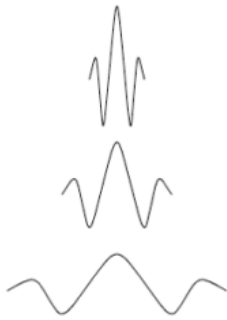
- decomposition

$$W(a,b) = K \int_{-\infty}^{+\infty} \psi^*\left(\frac{x-a}{b}\right) f(x) dx$$

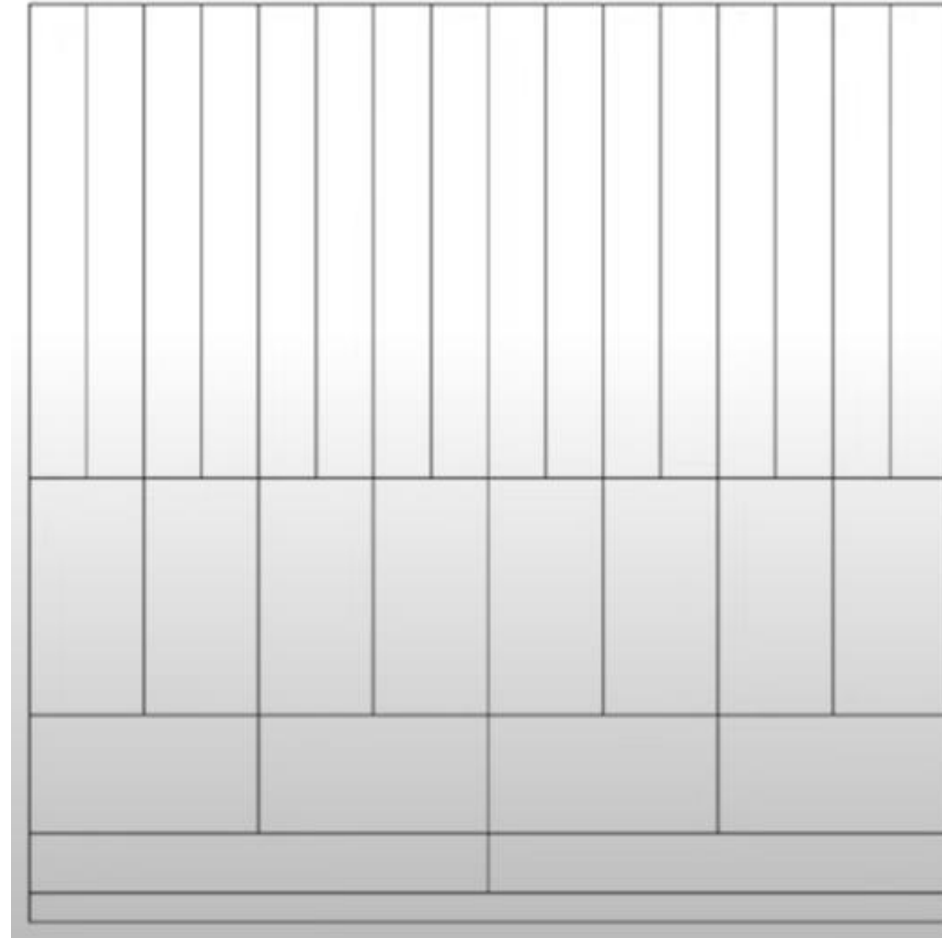
Wavelet decomposition

- MRA

Analyses signal into different frequencies at different resolutions.



Freq



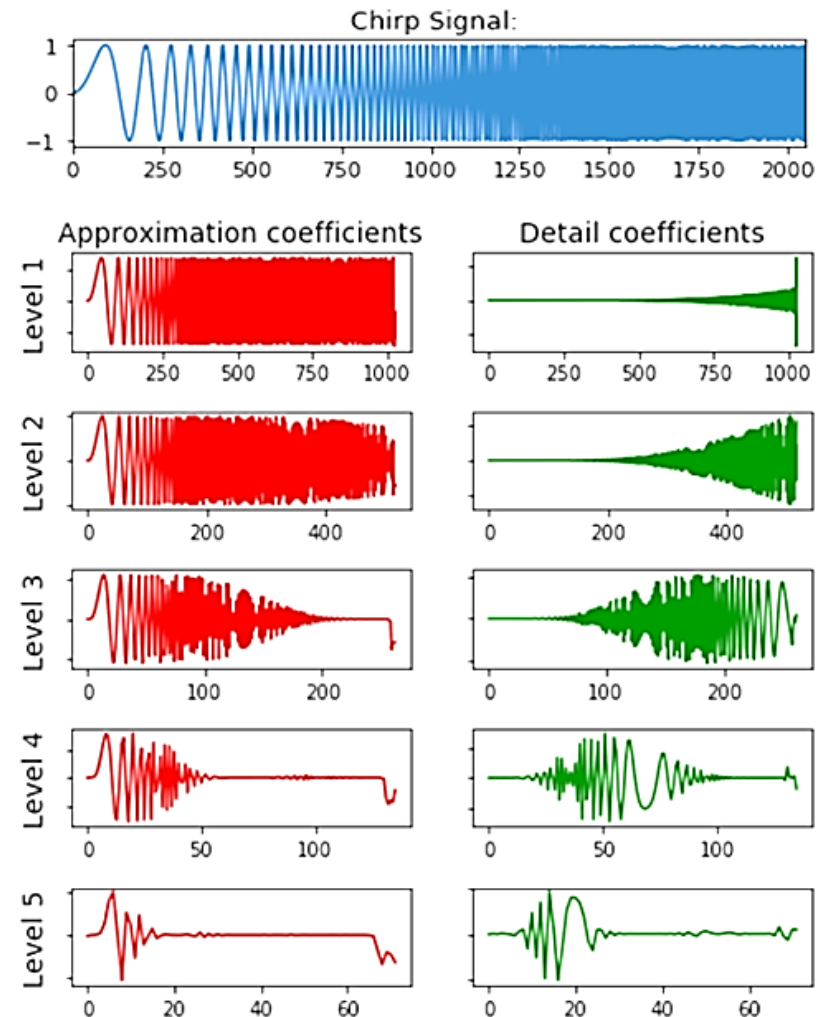
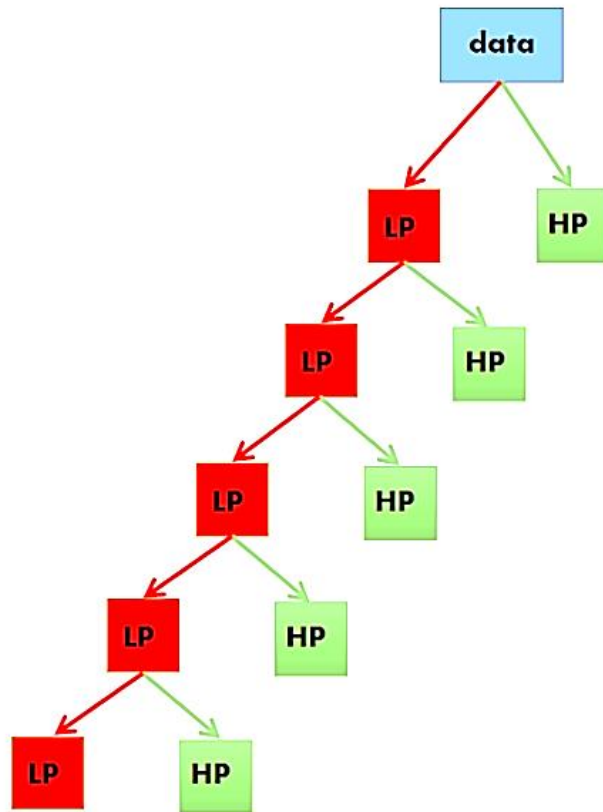
Time

Time Res Inc

Freq Res Inc

Wavelet decomposition

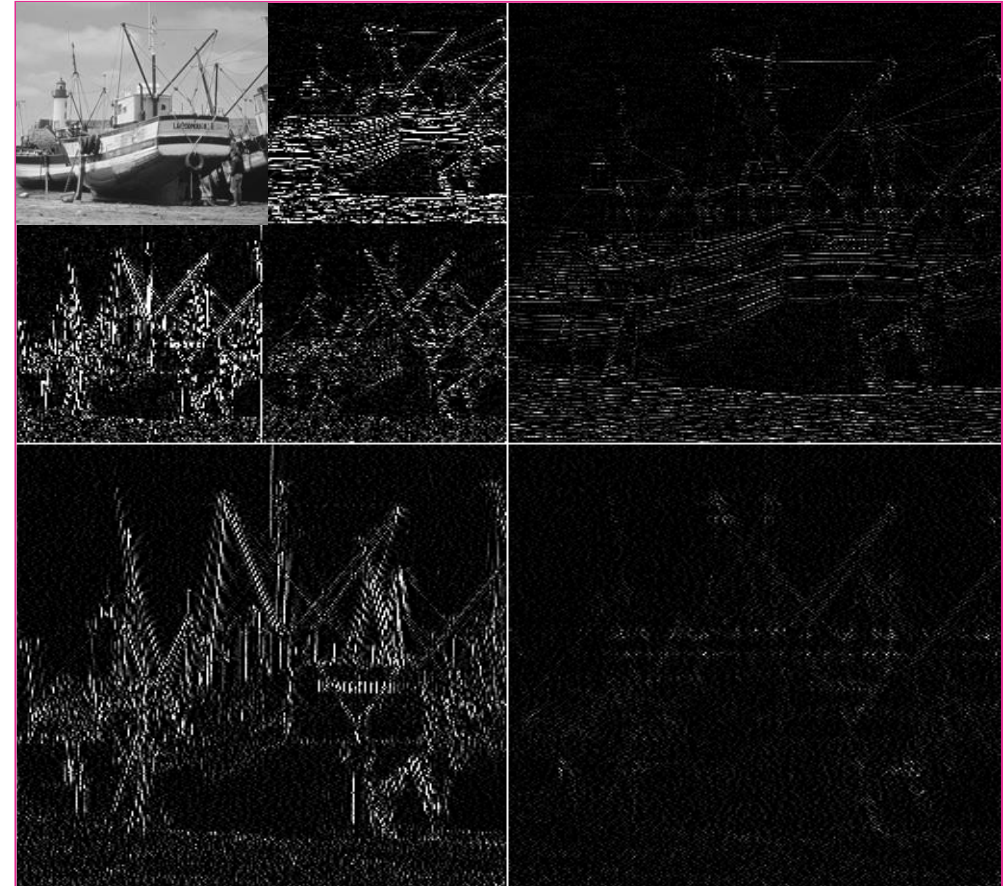
- Upchirp



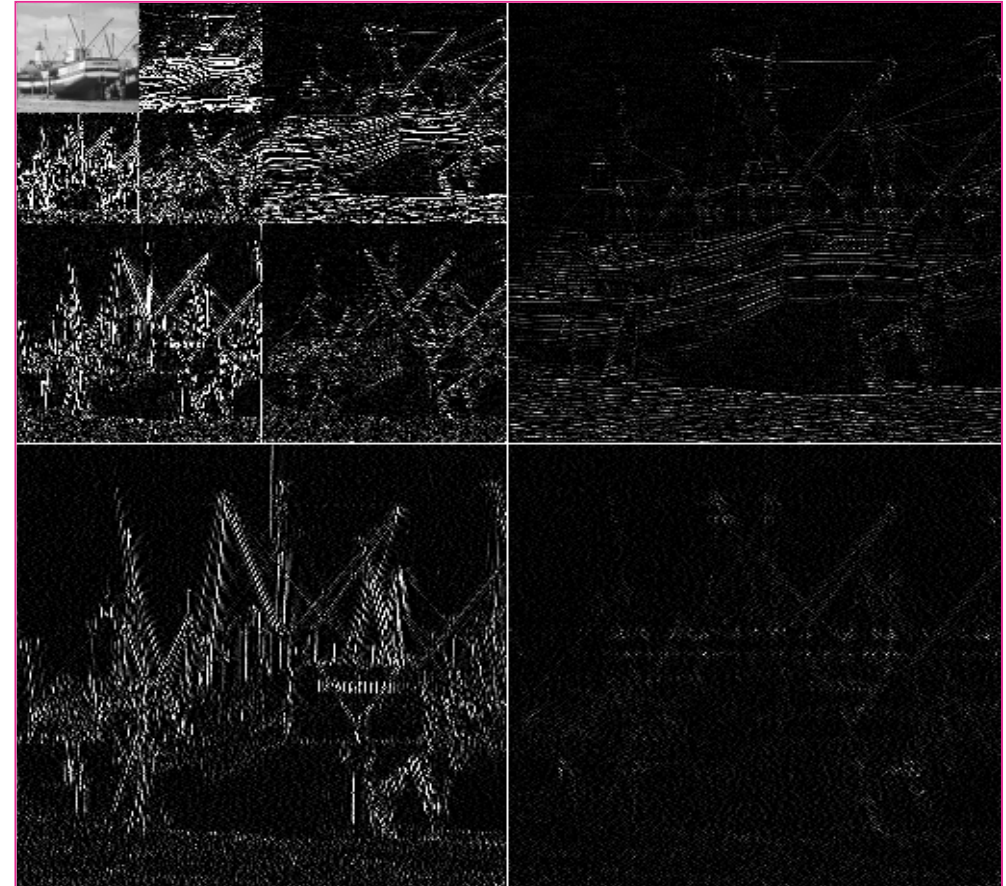
Wavelet decomposition



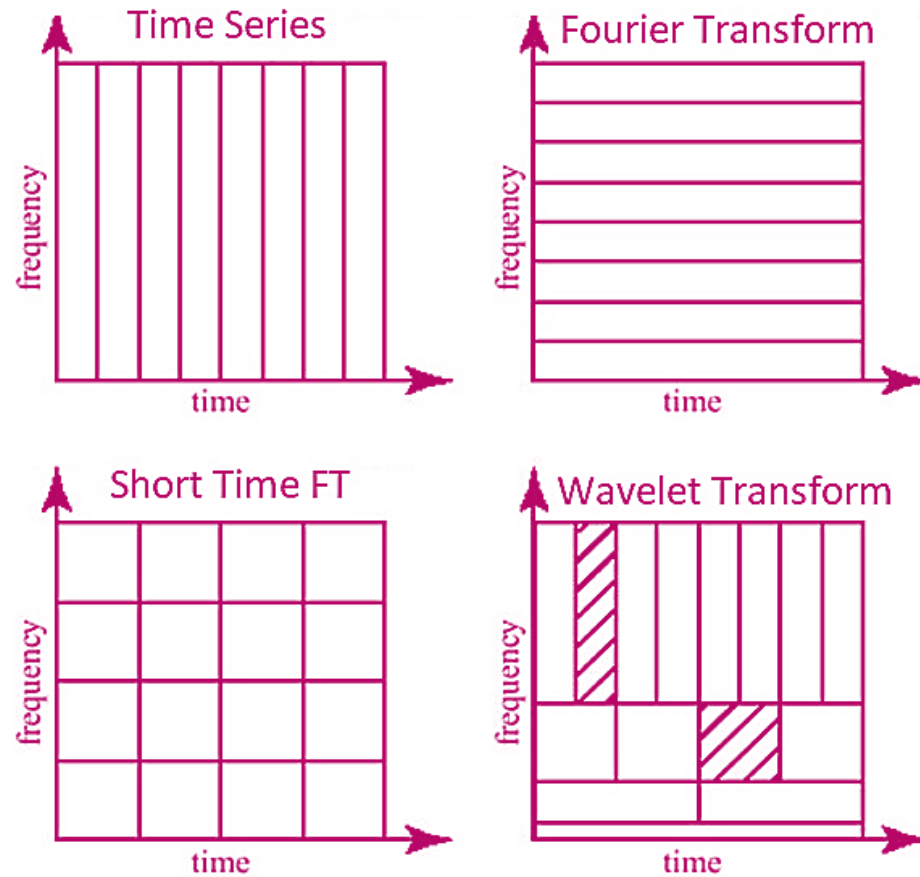
Wavelet decomposition



Wavelet decomposition



Time & frequency resolutions



Wavelet denoise

- Wavelet decompositions
 - useful in compression as well as denoise
 - importance of edges
 - maintaining edges while denoising is of critical importance

Wavelet denoise

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input



salt & pepper noise

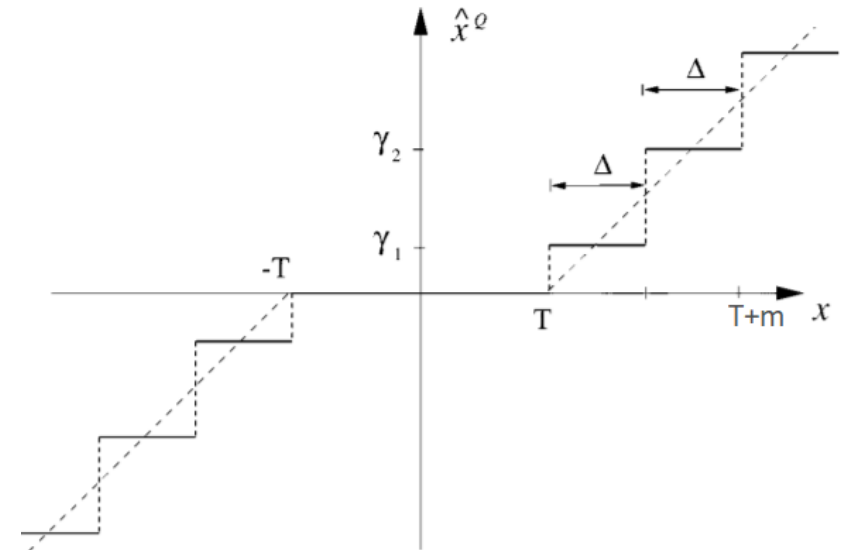
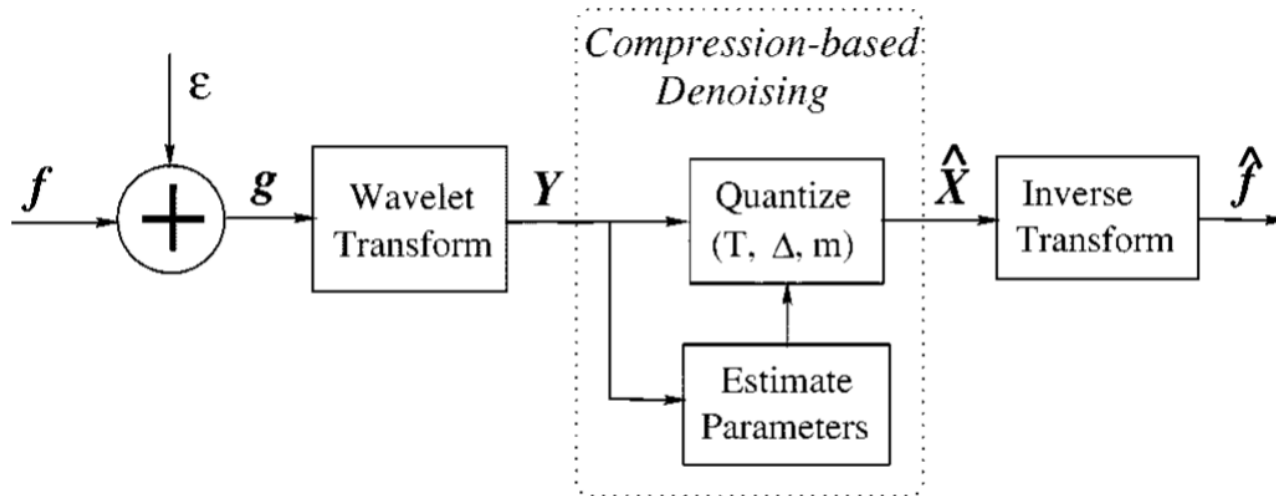


low pass denoised



Wavelet denoise

- Compression based denoising



Wavelet image denoising

- find DWT of an image
- threshold on DWT coefficients
 - sub-band adaptive TH
 - universal (soft/hard) TH
- find IDWT

Input



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Wavelet denoised



Wavelet image denoising

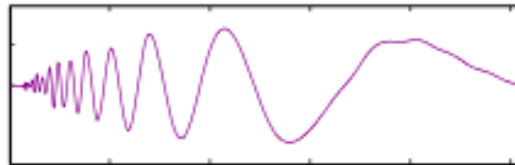
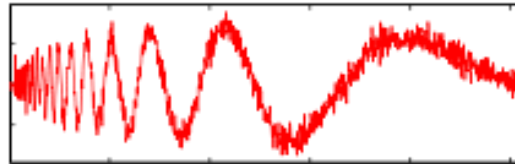


Wavelet image denoising



Conclusion

- Wavelet denoising



Conclusion

- Wavelet denoising

□ MRA

- Denoising
- Wavelet transform
- Thresholding in wavelet domain
- Inverse wavelet transform

