

July 29, 2021

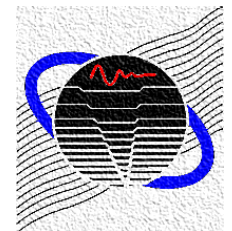
# Introduction to Wavelets

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David Herrin  
University of Kentucky

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**Vibro-Acoustics Consortium**

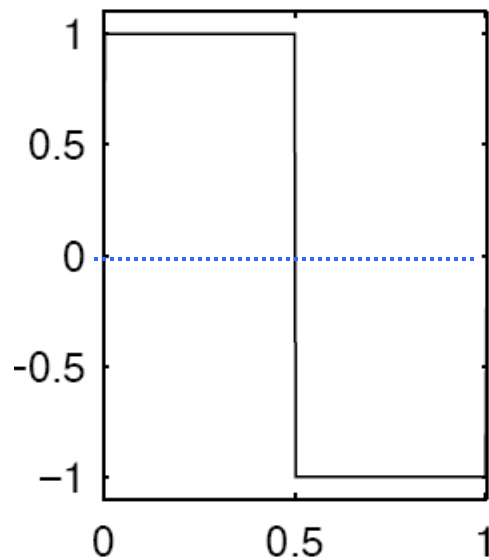


# What is a Wavelet?

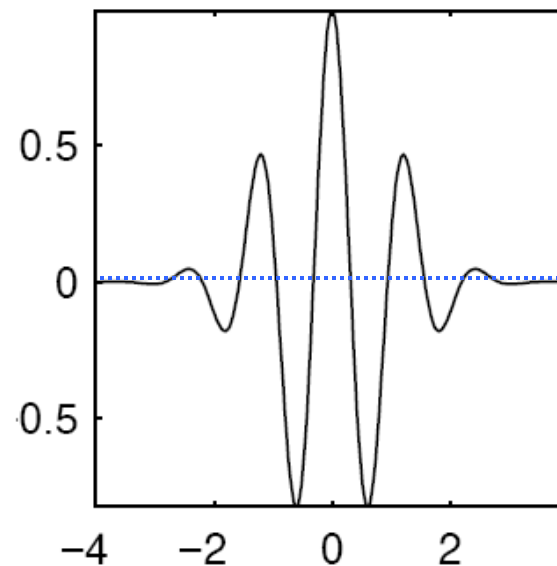
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A waveform of limited duration with an average value of zero (i.e. a small wave).

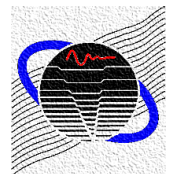
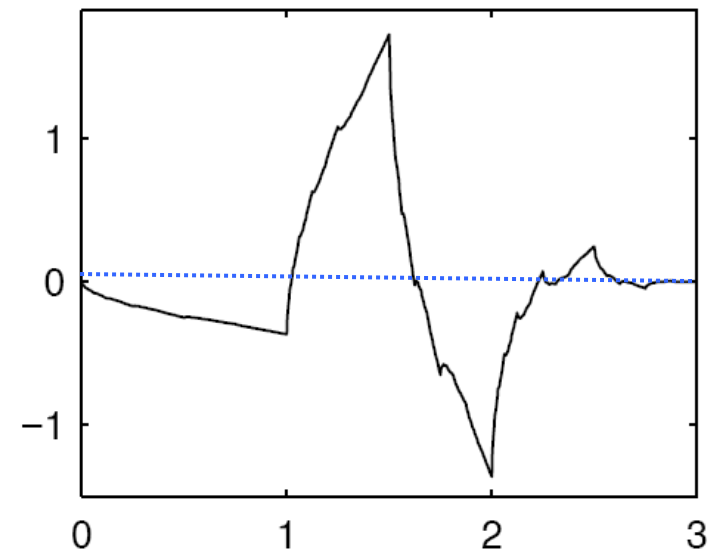
Haar Wavelet



Morlet Wavelet



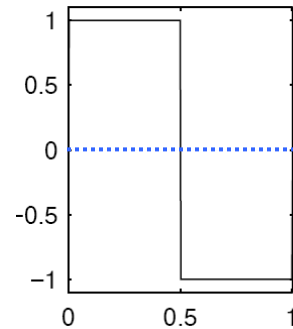
Daubechies 2 (db2)



# What is a Wavelet?

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Stretching the Haar Wavelet

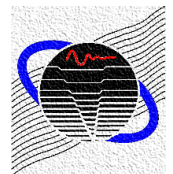


+1 -1

+1 +1 -1 -1

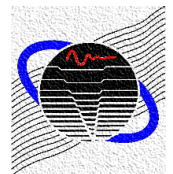
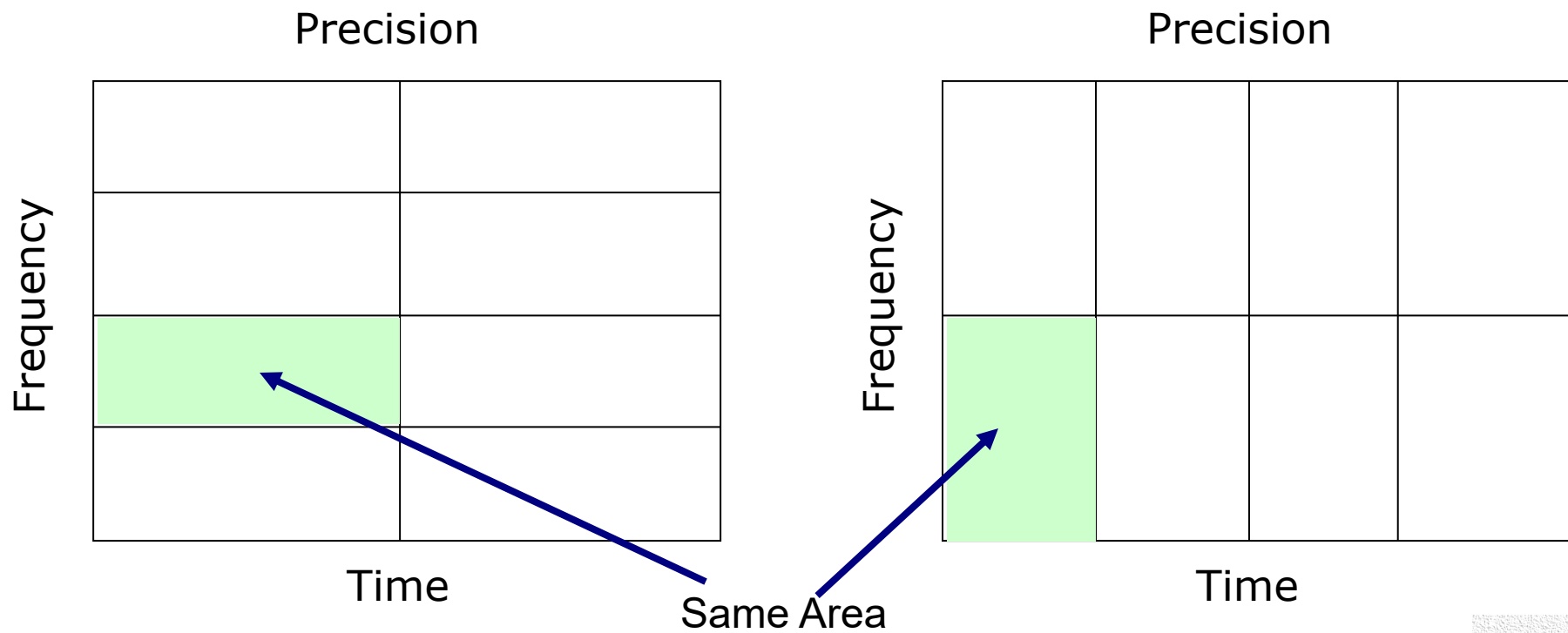
+1 +1 +1 +1 -1 -1 -1 -1

+1 +1 +1 +1 +1 +1 +1 +1 -1 -1 -1 -1 -1 -1 -1 -1



# What is a Wavelet?

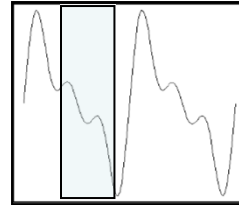
Heisenberg Uncertainty Principle – It is impossible to know exact frequency content at an exact time.



# Wavelet Transform

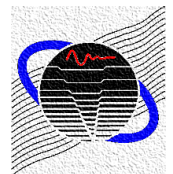
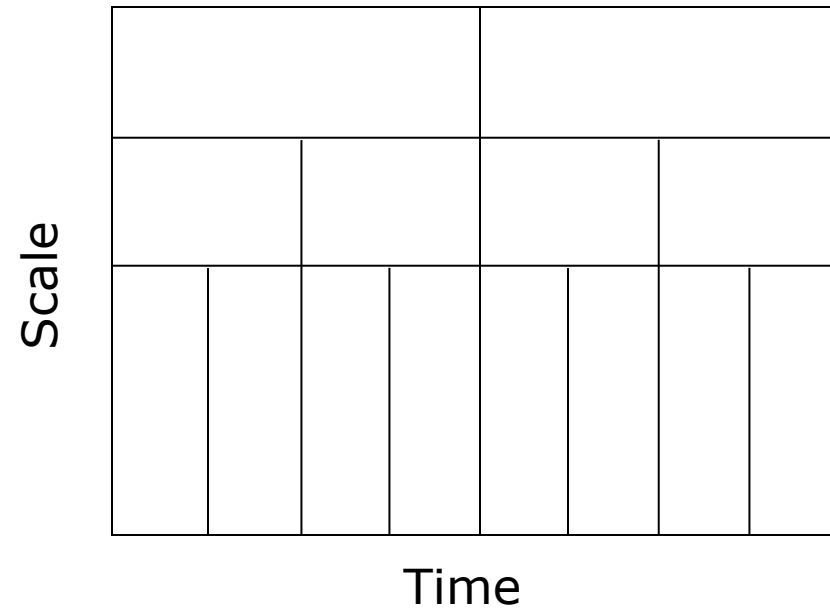
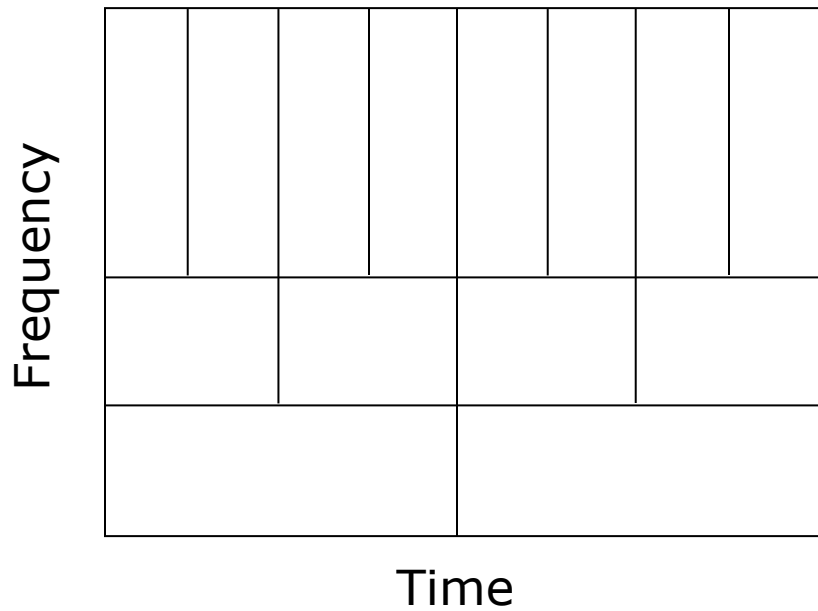
Intuitively

Precision



Wavelet

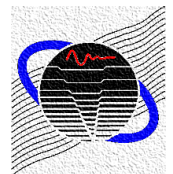
Precision



## Music Analogy (i.e. Scale)

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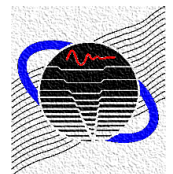
Low notes (low frequency) need longer to be correctly generated while high notes (high frequency) can be generated quickly.



# Wavelet Transforms

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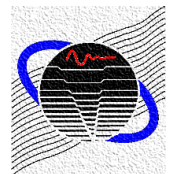
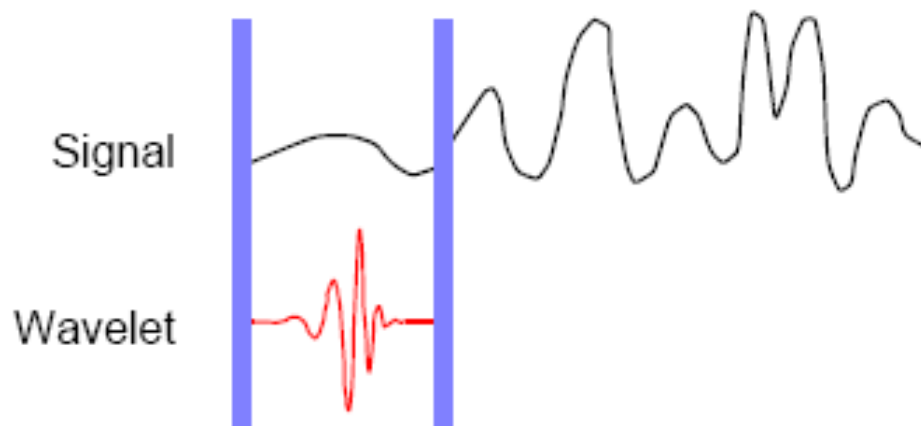
- Continuous Wavelet Transform
- Discrete Wavelet Transform



# Continuous Wavelet Transform Step 1

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Take a wavelet and compare it to a section at the start of the original signal.

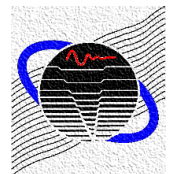
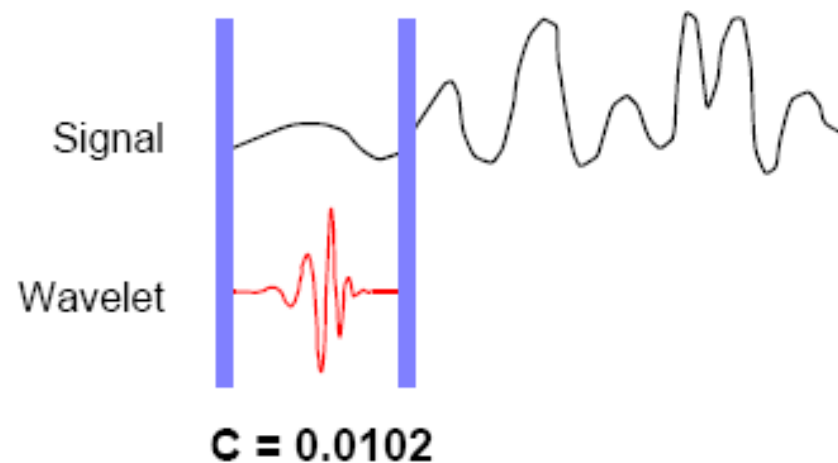




## Continuous Wavelet Transform Step 2

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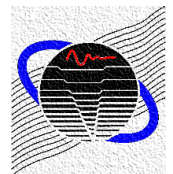
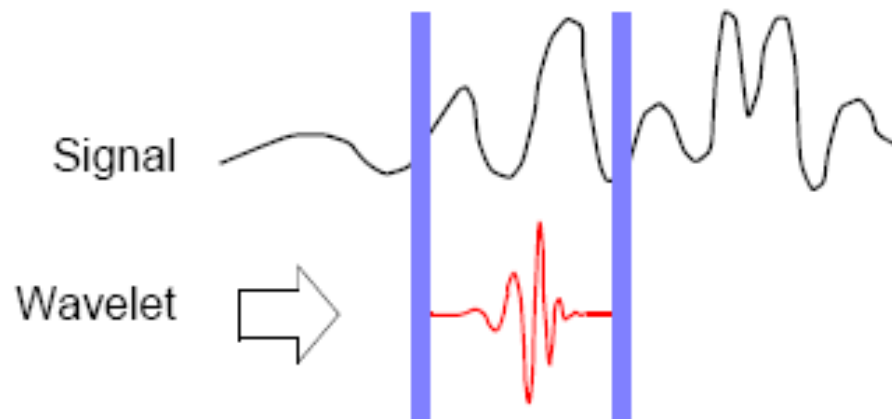
Calculate a number  $C$  that indicates how closely correlated the wavelet is with this section of the signal. The higher  $C$  is the more similarity. Correlation depends partly on the wavelet selected.



## Continuous Wavelet Transform Step 3

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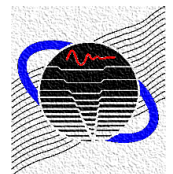
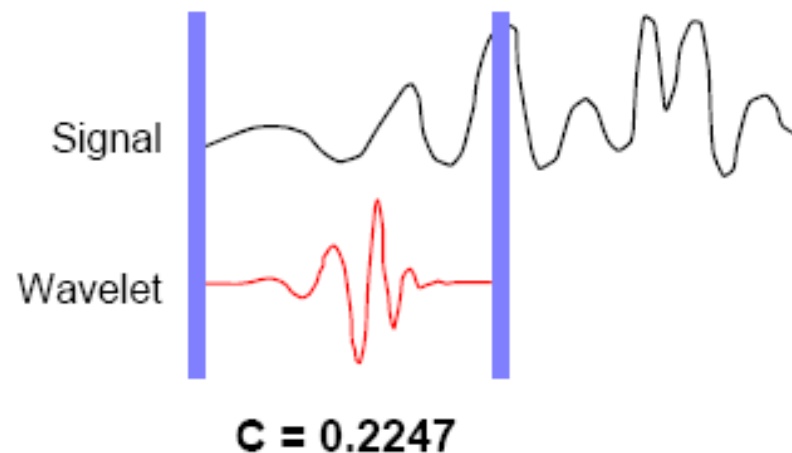
Shift wavelet slightly to the right and repeat steps 1 and 2.



# Continuous Wavelet Transform Step 4

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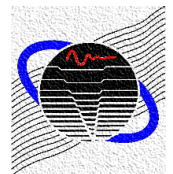
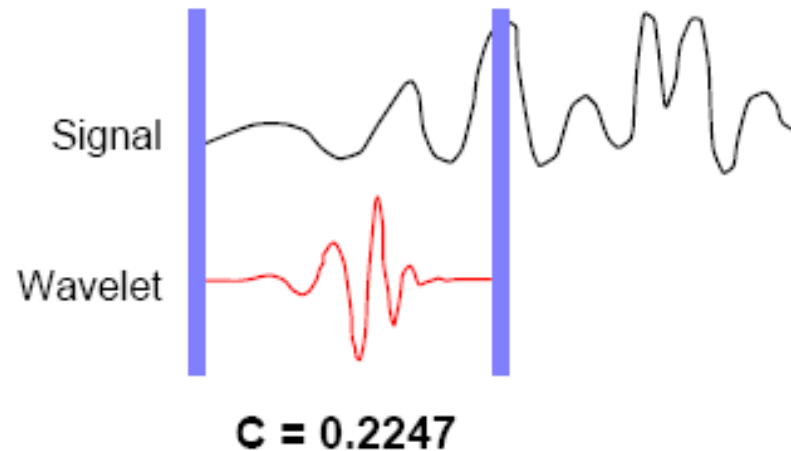
Scale (stretch) the wavelet slightly and repeat again.



## Continuous Wavelet Transform Step 5

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Repeat the process for all scales. If we do this at 10 scales and for 400 time steps, we will have a 400 by 10 set of correlation coefficients. A wavelet that resembles what you are looking for will give a strong correlation at some stretch and shift.



# Continuous Wavelet Transform

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Correlation Coefficient

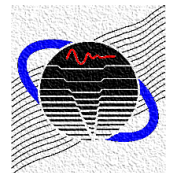
Time Signal

Wavelet Signal

$$C(a, b) = \frac{1}{\sqrt{a}} \int_{-\infty}^{+\infty} f(t) \psi \left( \frac{t - b}{a} \right) dt$$

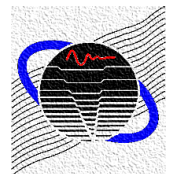
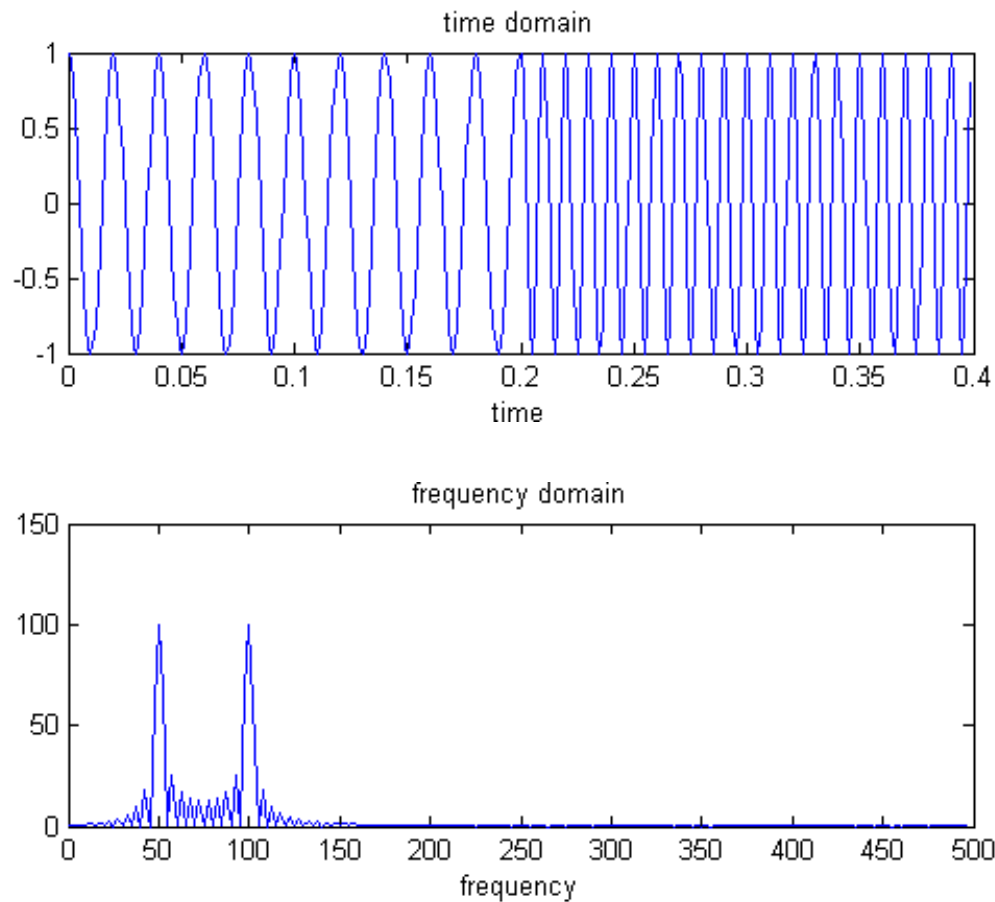
Translation (Position) Parameter

Scale (Dilation) Parameter



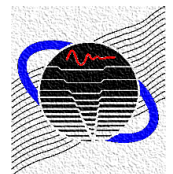
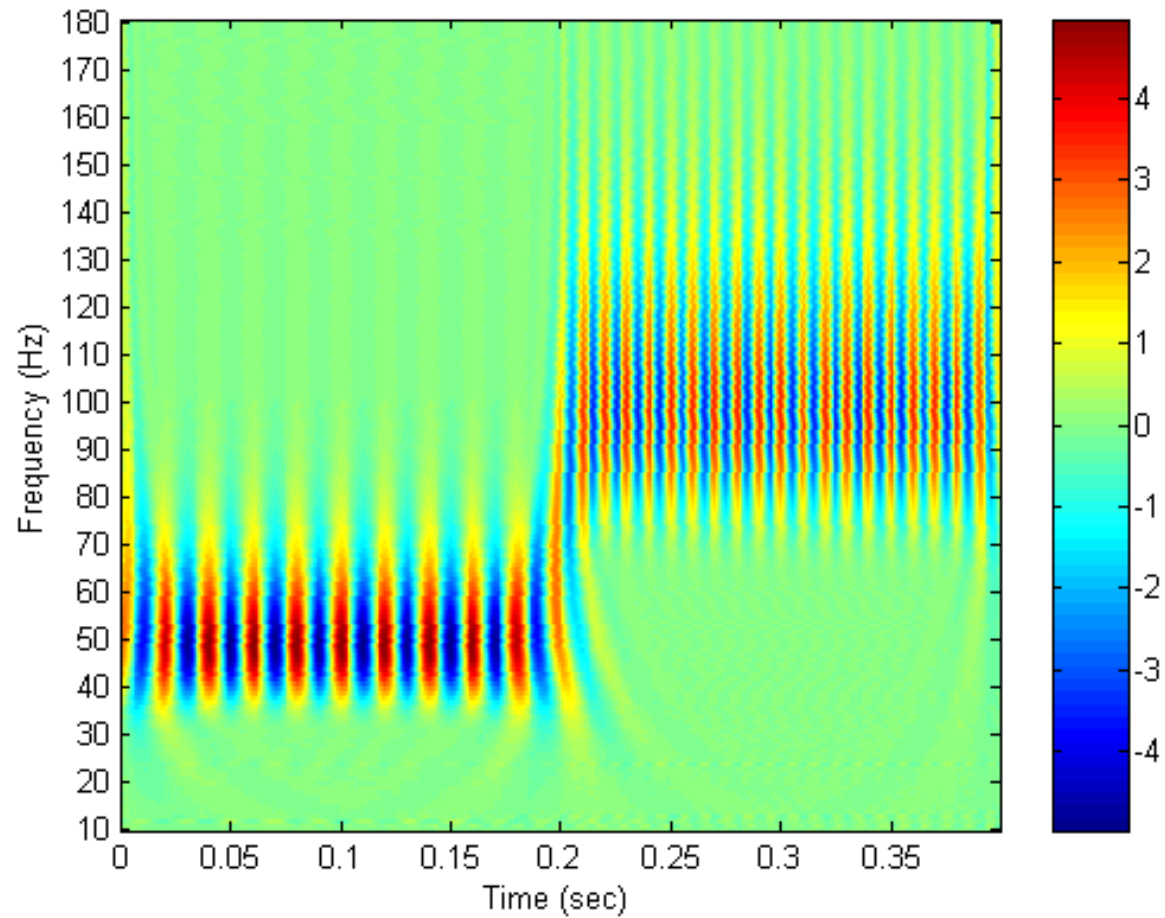
# Example Non-Stationary Signal

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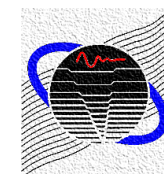
# Example Non-Stationary Signal

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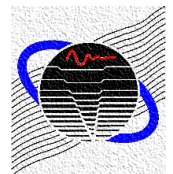
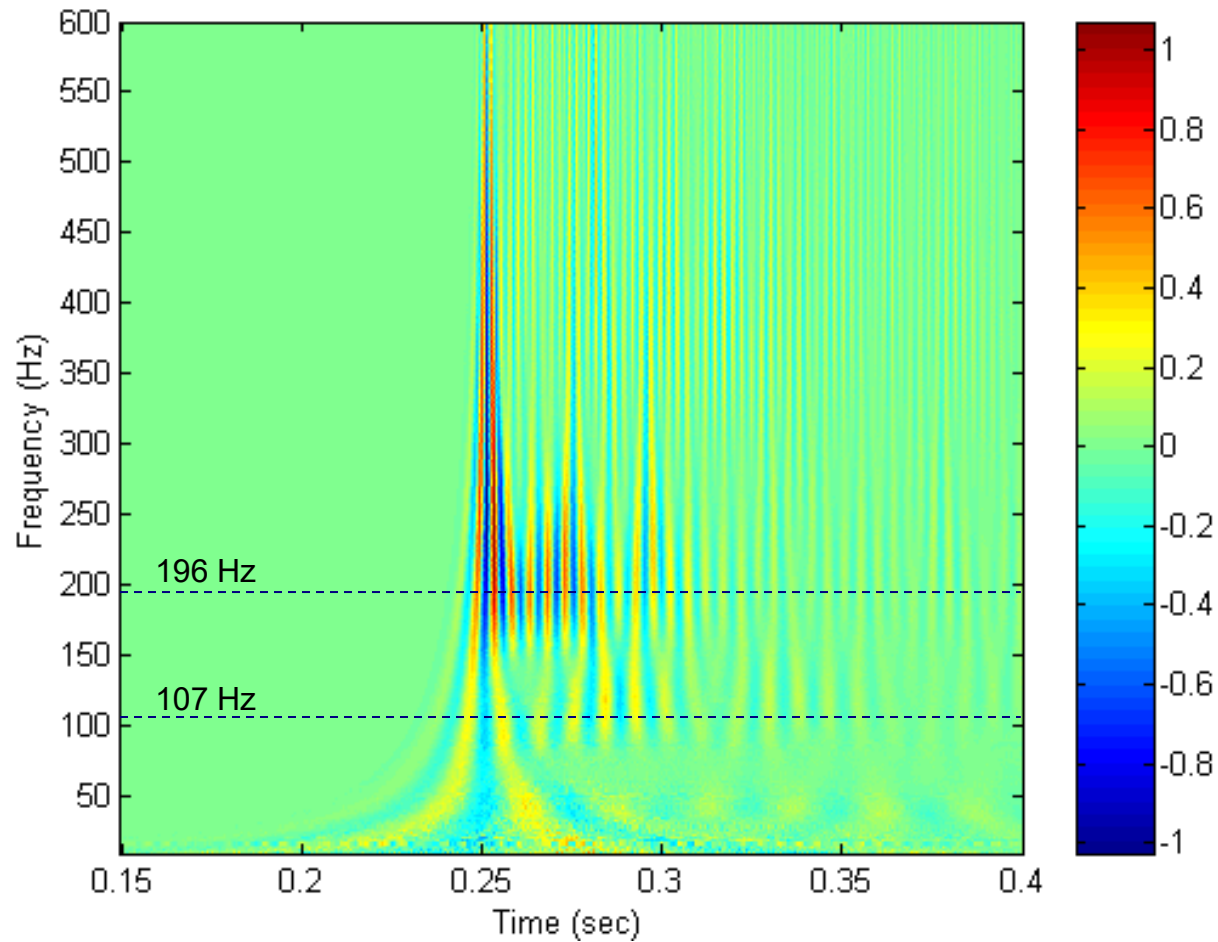
# Example Cab Reverberation

Balloon located close to door towards front of the passenger compartment.





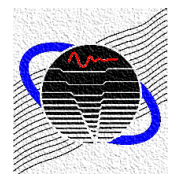
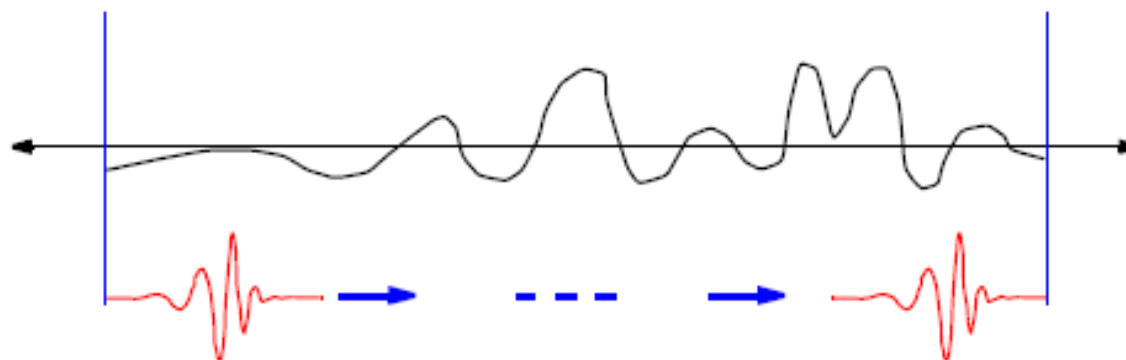
# Example Cab Reverberation



# Continuous Wavelet Transform

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- ✓ Smooth shifting and scaling
- ✓ Use any wavelet you want
- ✓ Inverse CWT is difficult

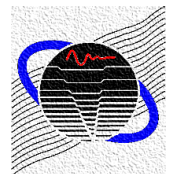
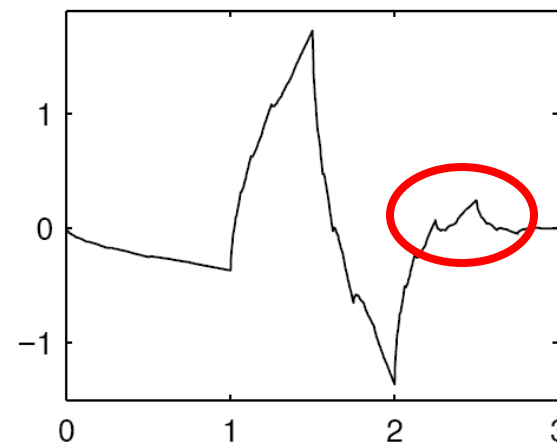


# Discrete Wavelet Transform

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- ✓ Signals can be reconstructed after being DWT
- ✓ Scales are powers of 2
- ✓ Wavelets must be constructed from digital filters

Daubechies 2 (db2)



# Wavelet Filters

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Low Pass Filter



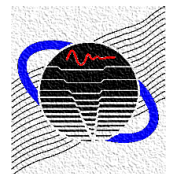
Low Pass Reconstruction Filter



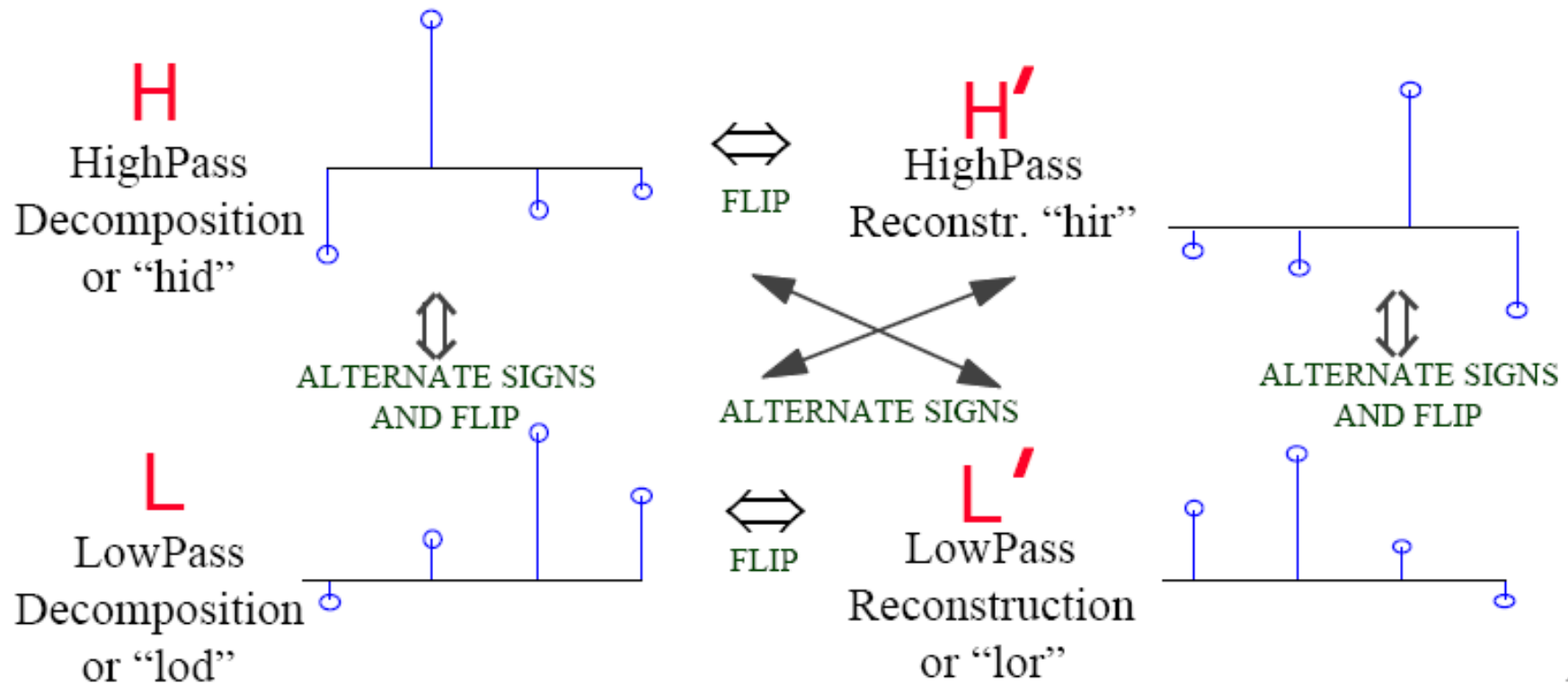
High Pass Filter



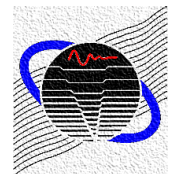
High Pass Reconstruction Filter



# Wavelet Filters

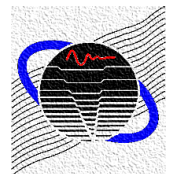
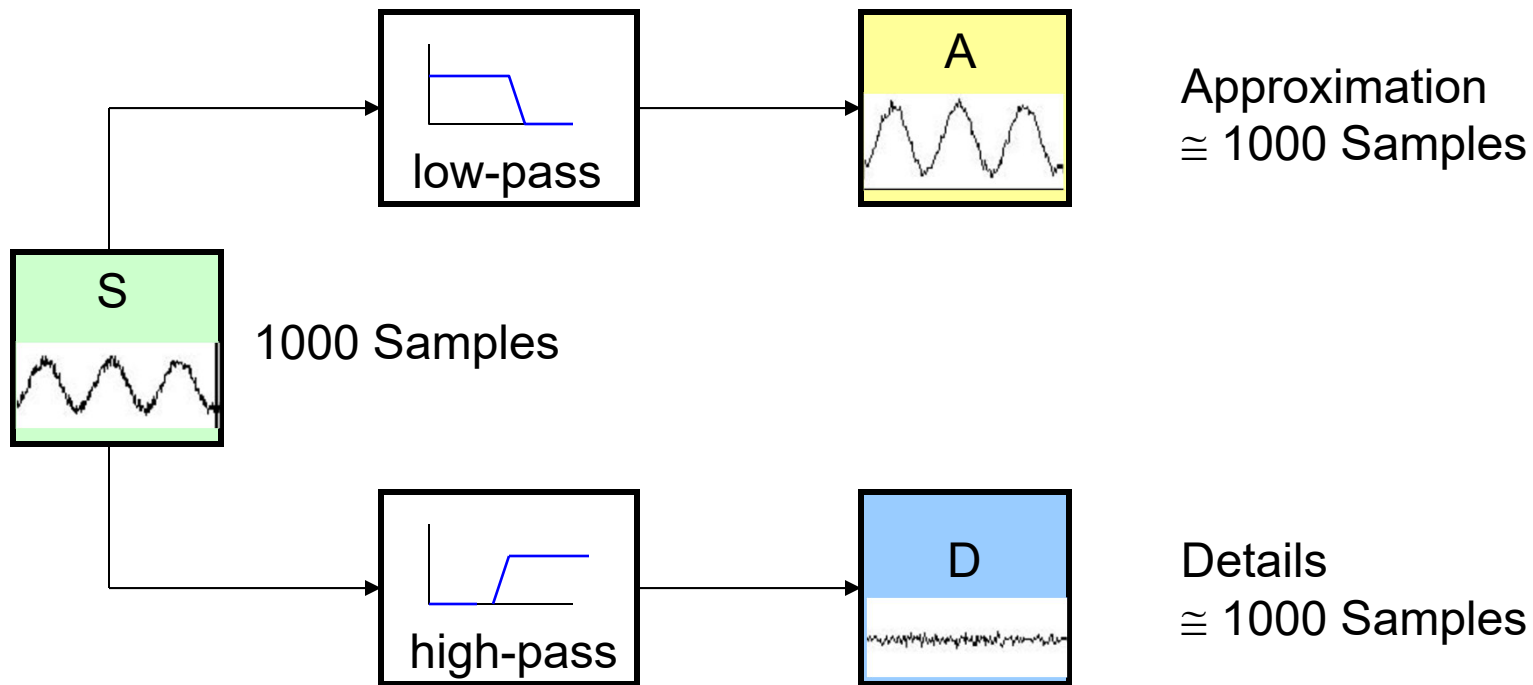


1

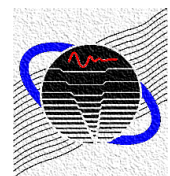
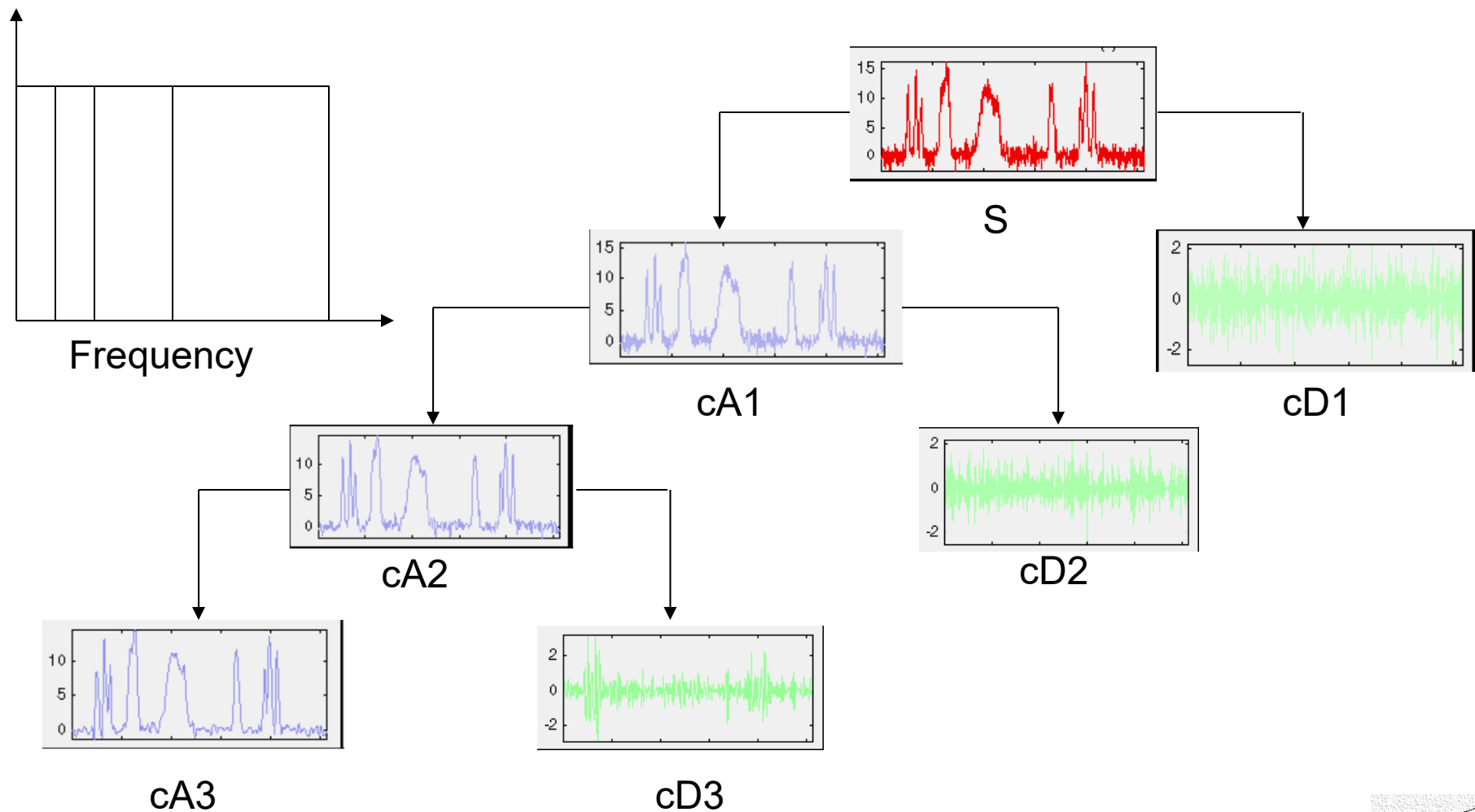


# Approximation and Details

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# Multiple Level Decomposition



# Downsampling and Upsampling

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Original Signal

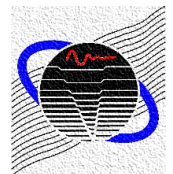
0.12 0.15 0.18 0.15 0.12 0.09 0.06 0.03 0.00 0.03 0.05 0.09 0.12

Downsampled Signal (remove every other data point)

0.12 0.18 0.12 0.06 0.00 0.05 0.12

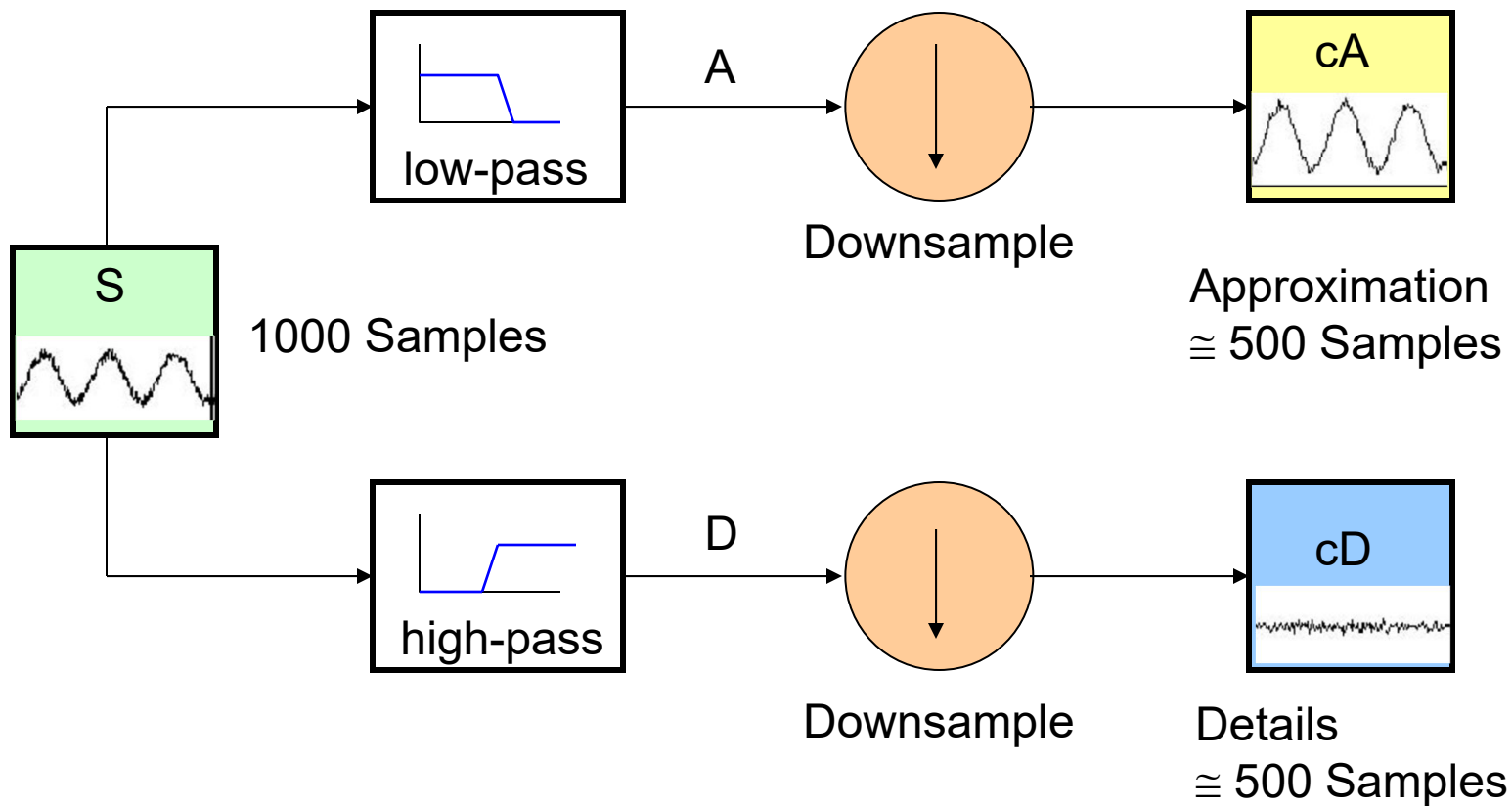
Upsampled Signal (insert 0's between every other data point)

0.12 0.00 0.18 0.00 0.12 0.00 0.06 0.00 0.00 0.00 0.05 0.00 0.12

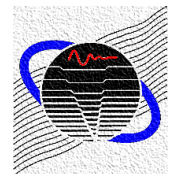




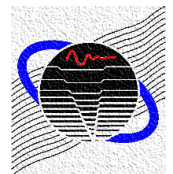
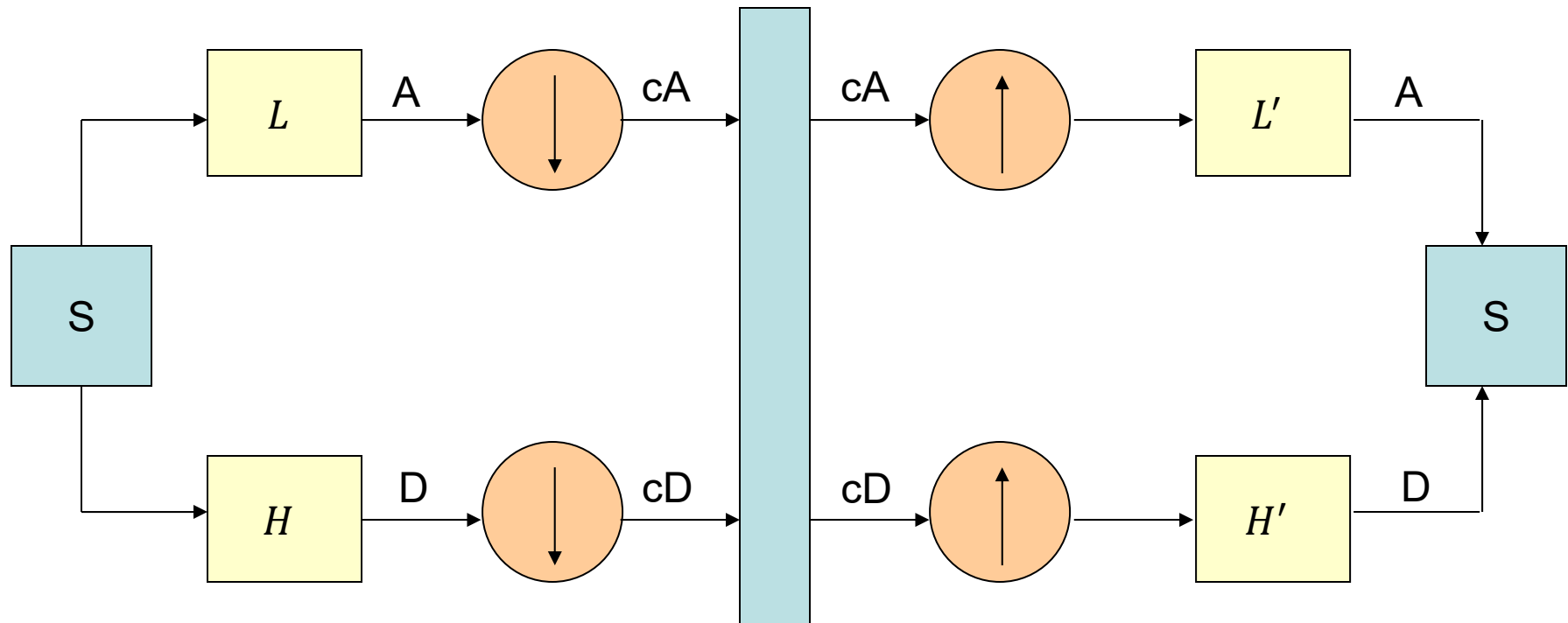
# With Wavelet Filters



Downsample – Throw away every other term in the data



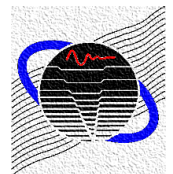
# Discrete Wavelet Transform



# Wavelet Transforms

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- Continuous Wavelet Transform
- Discrete Wavelet Transform



# Wavelets Reference

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D. L. Fugal, Conceptual Wavelets in Digital Signal Processing: an In-Depth, Practical Approach for the Non-Mathematician, Space and Signals Technical Publishing, San Diego (2009).

