

HIGH-RESOLUTION COMPLEX TIME-FREQUENCY ANALYSIS

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Overview

- Introduction
- Classical Methods
- Wigner-Ville Distribution
- Complex Short Term Auto-Regressive Methods
- Numerical Results
- Conclusions
- Selected References

Introduction

- Time-Frequency Analysis in
 - Seismics
 - Seismology
 - Volcanology
 - Astrophysics
- Given a time signal, create a time-varying frequency field

- Classical methods use the real signal.
- Here:
 - ▶ Use the analytic signal or complex trace;
 - ▶ Short-time window;
 - ▶ Burg, Marple and Morf algorithms.

Classical Methods

- Spectrogram or Short-Term Fourier Transform(STFT):
 - ▶ DFT, possibly weighed, of a short segment of a real signal;
 - ▶ No model for the data, but low resolution and leakage

Classical Methods

- Short-Term Autoregressive model (STAR):
 - ▶ Estimate an AR model from a short segment of a real signal spectrum;
 - ▶ Use inverse of the AR model;
 - ▶ Attain higher resolution;
 - ▶ Must determine AR model order.

Wigner-Ville Distribution

- Works with analytic signal (complex trace).
- Shows interference between harmonic signals due to the quadratic nature of the method.
- To reduce interference use a maximum entropy method (Burg) to compute a complex prediction error filter to predict the kernel in WV distribution (MEWV).

High-Resolution Complex Time-Frequency Analysis

- Uses the analytic signal;
- Computes a complex AR model in a short-time window (CSTAR);
- Uses only data inside the window.
- Makes no assumptions about the signal outside the window.

High-Resolution Complex Time-Frequency Analysis

- Algorithms:
 - Burg,
 - Marple
 - Morf
- All minimize the sum of forward and backward prediction error energies.

About Algorithms

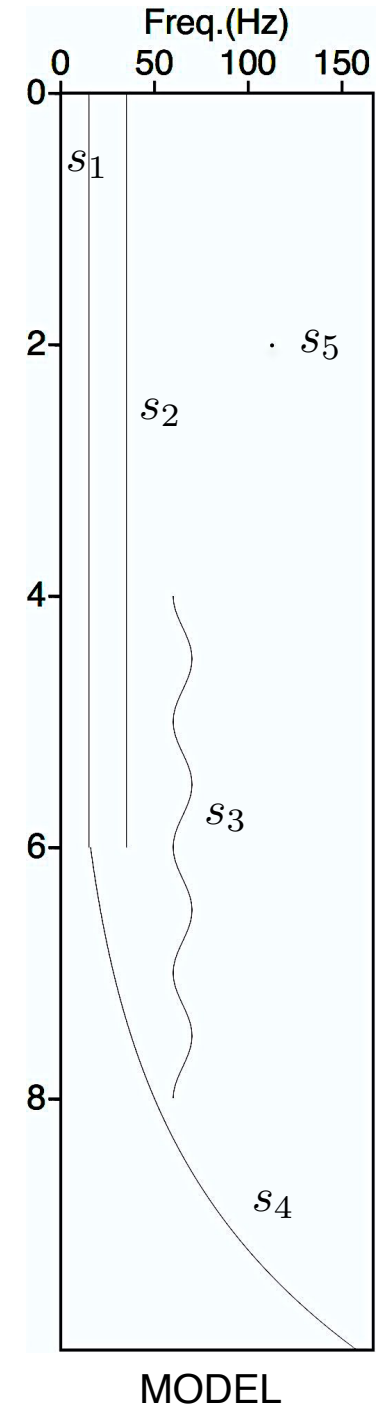
- Burg and Marple set the forward and backward prediction error operator(PEO) equal.
- Burg minimizes with respect to reflection coefficient in the Levinson algorithm.
- Marple minimizes with respect to the coefficients in the PEO.
- Morf minimizes with respect to separate forward and backward PEO's.

Synthetic Data

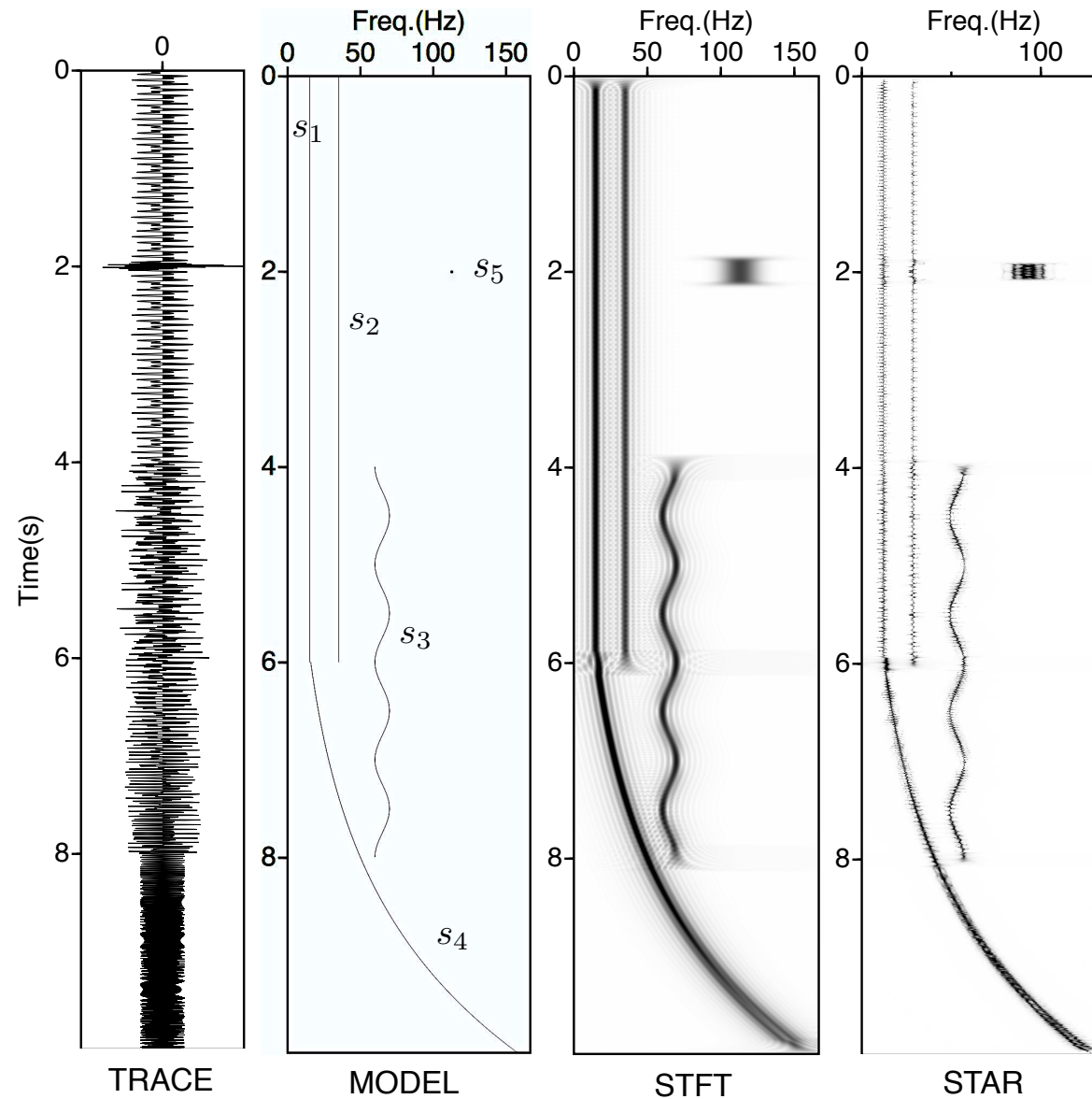
- Sum of five Signals:

$s_1(t) = 0.8 \cos(30\pi t)$	$0 \leq t \leq 6s$
$s_2(t) = 0.6 \cos(70\pi t)$	$0 \leq t \leq 6s$
$s_3(t) = 0.7 \cos(130\pi t + 5 \sin(2\pi t))$	$4s \leq t \leq 8s$
$s_4(t) = \sin\left(\frac{8\pi 100^{t/8}}{\log(100)}\right)$	$6s < t \leq 10s$
$s_5(t) = 3e^{-1250(t-2)^2} \cos 710(t-2)$	$0 \leq t \leq 10s$

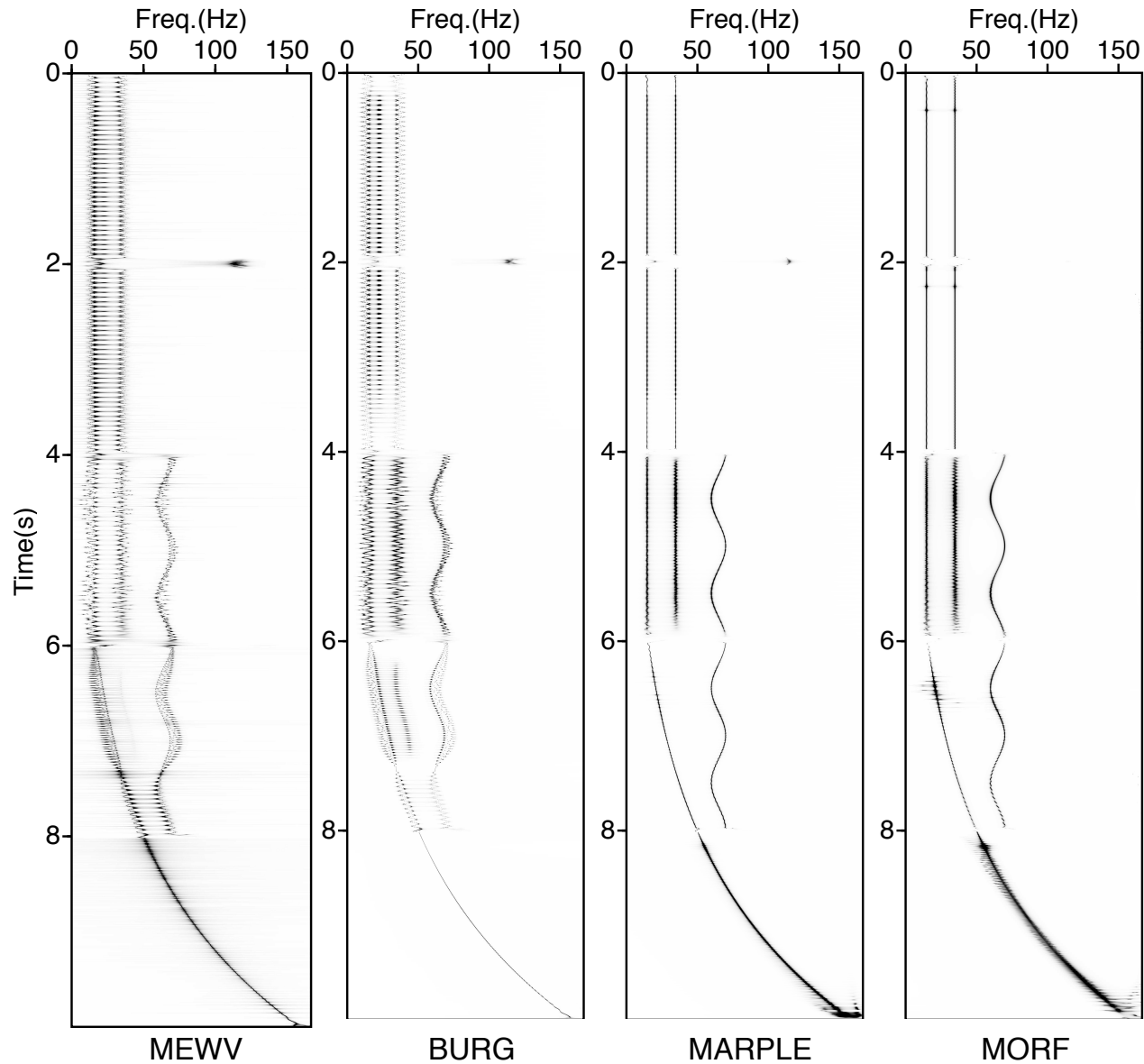
- ▶ Two harmonic signals s_1 and s_2 ($f=15$ and 35Hz);
- ▶ Frequency-modulated harmonic, s_3 ($f=65\text{Hz}$);
- ▶ Gliding harmonic, s_4 ($f=35$ to 158Hz);
- ▶ A Morlet wavelet, s_5 , at 113Hz .



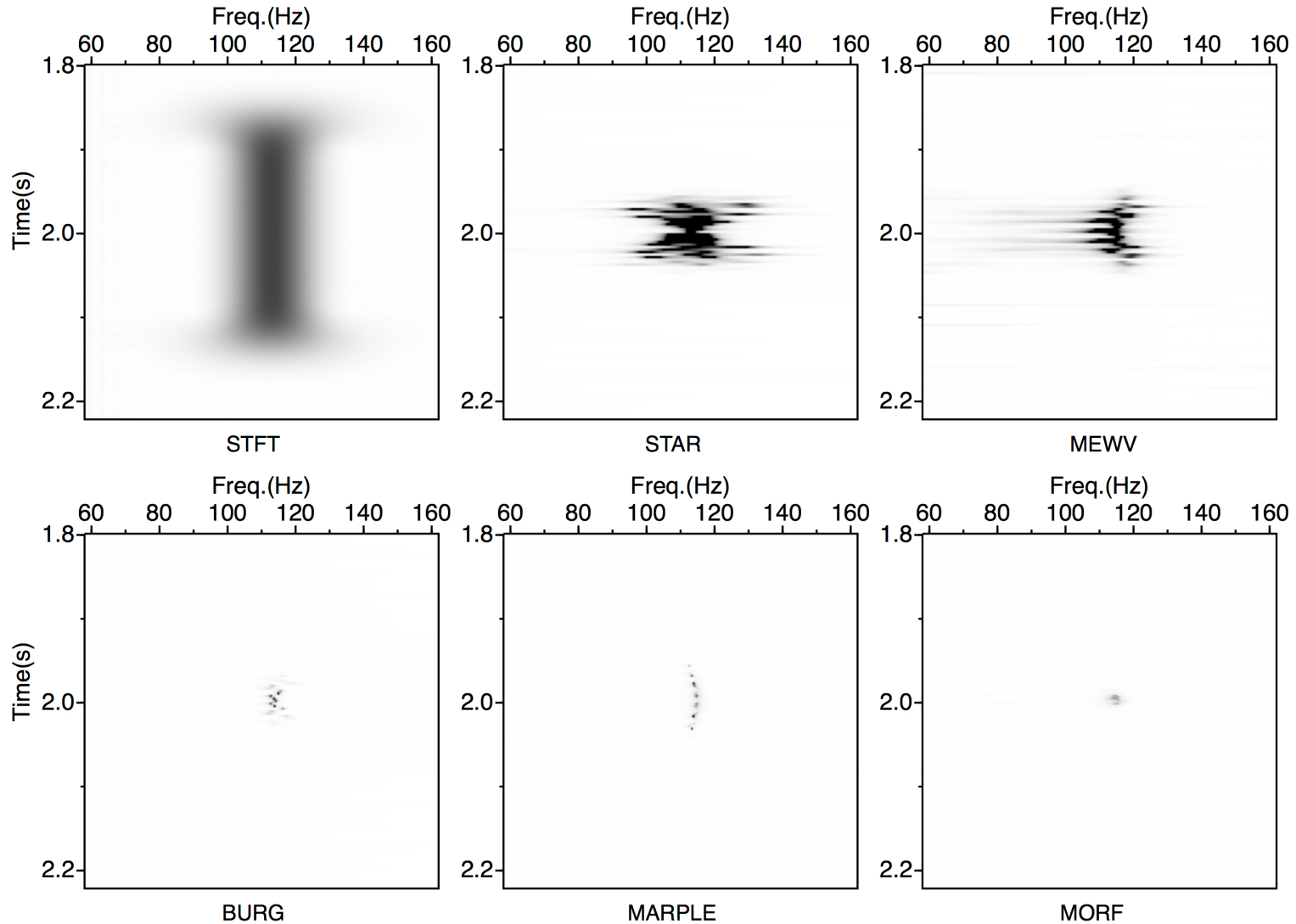
Synthetic Data - Classical Methods



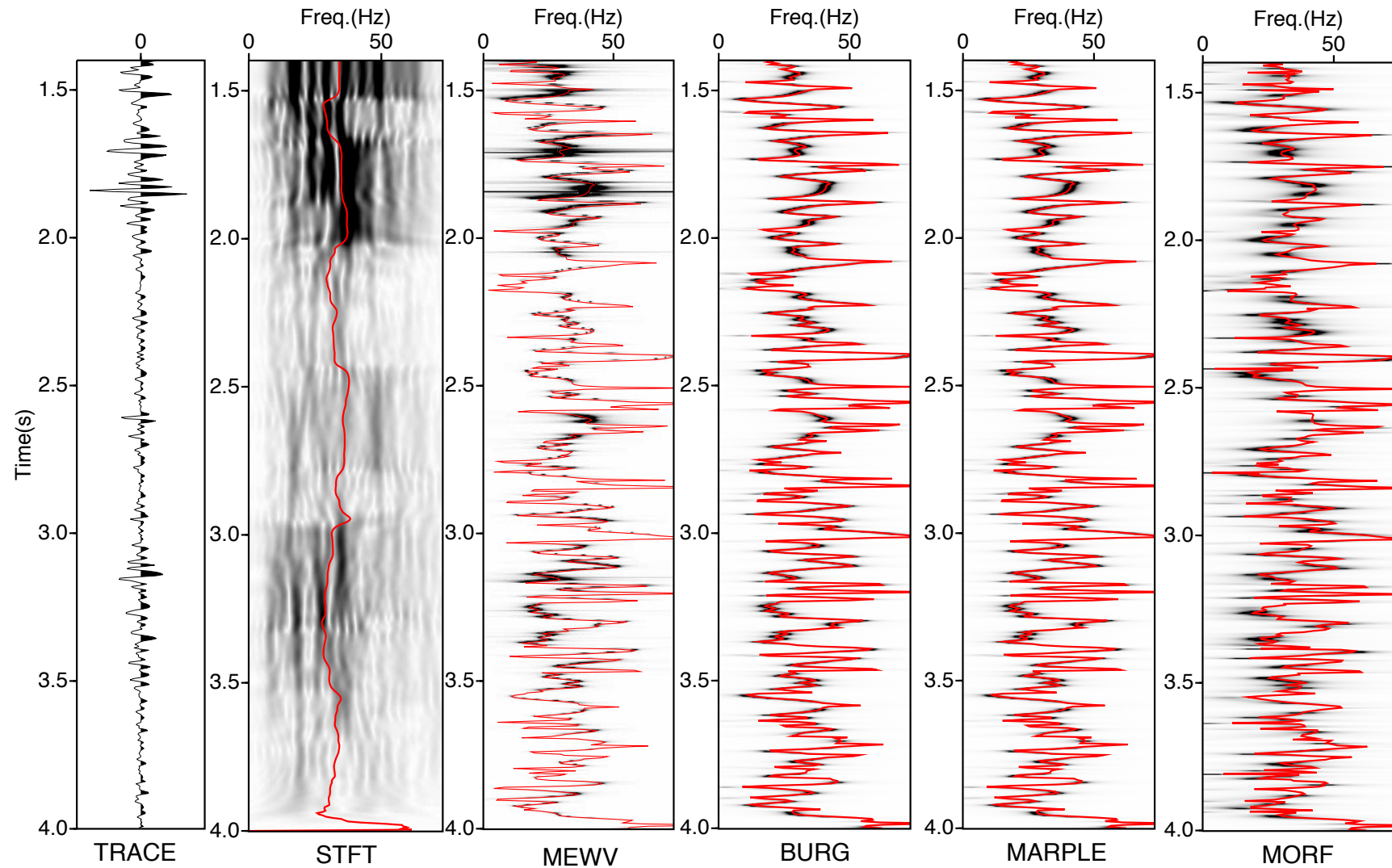
Synthetic Data - CSTAR



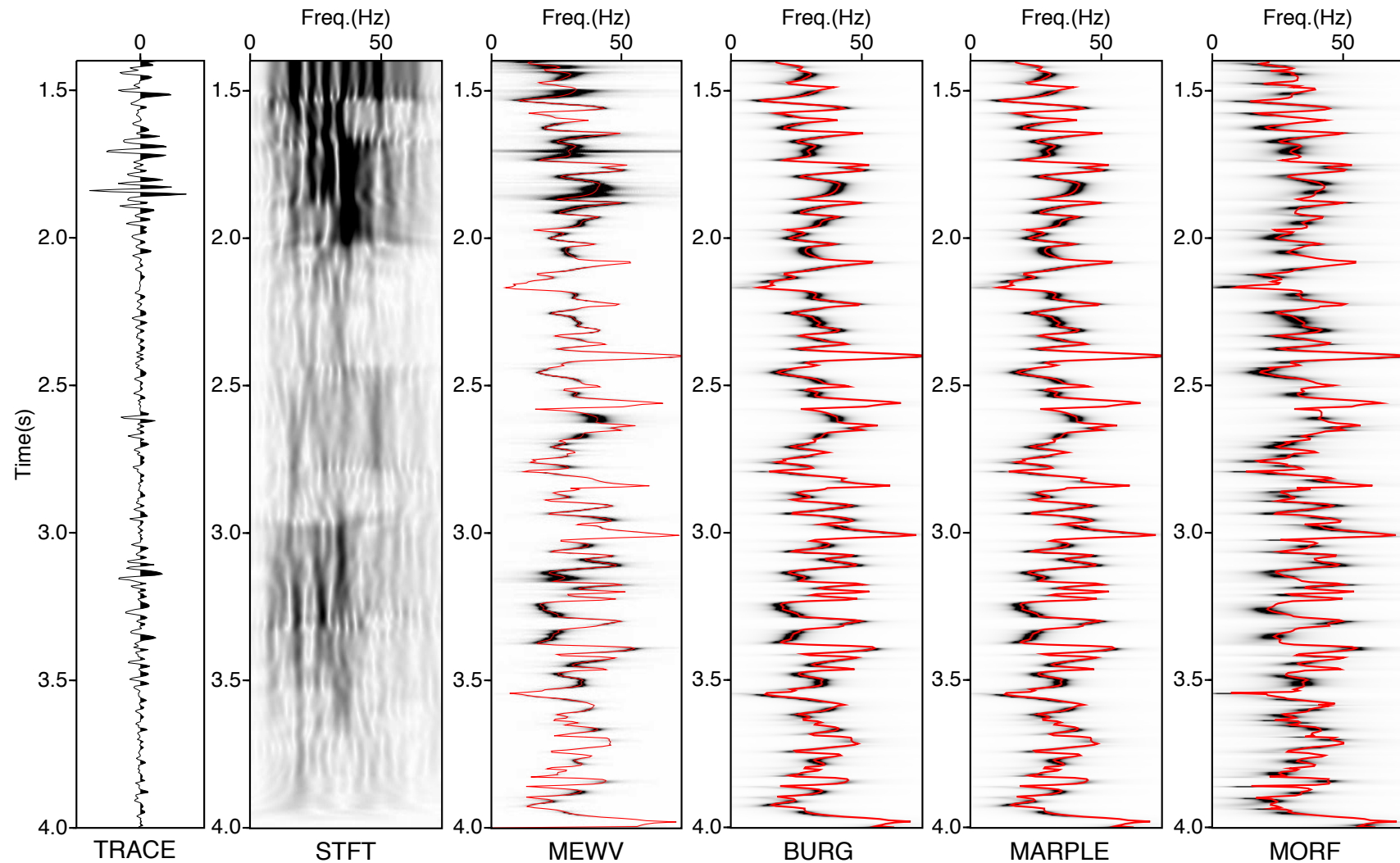
Enlarged Morlet wavelet



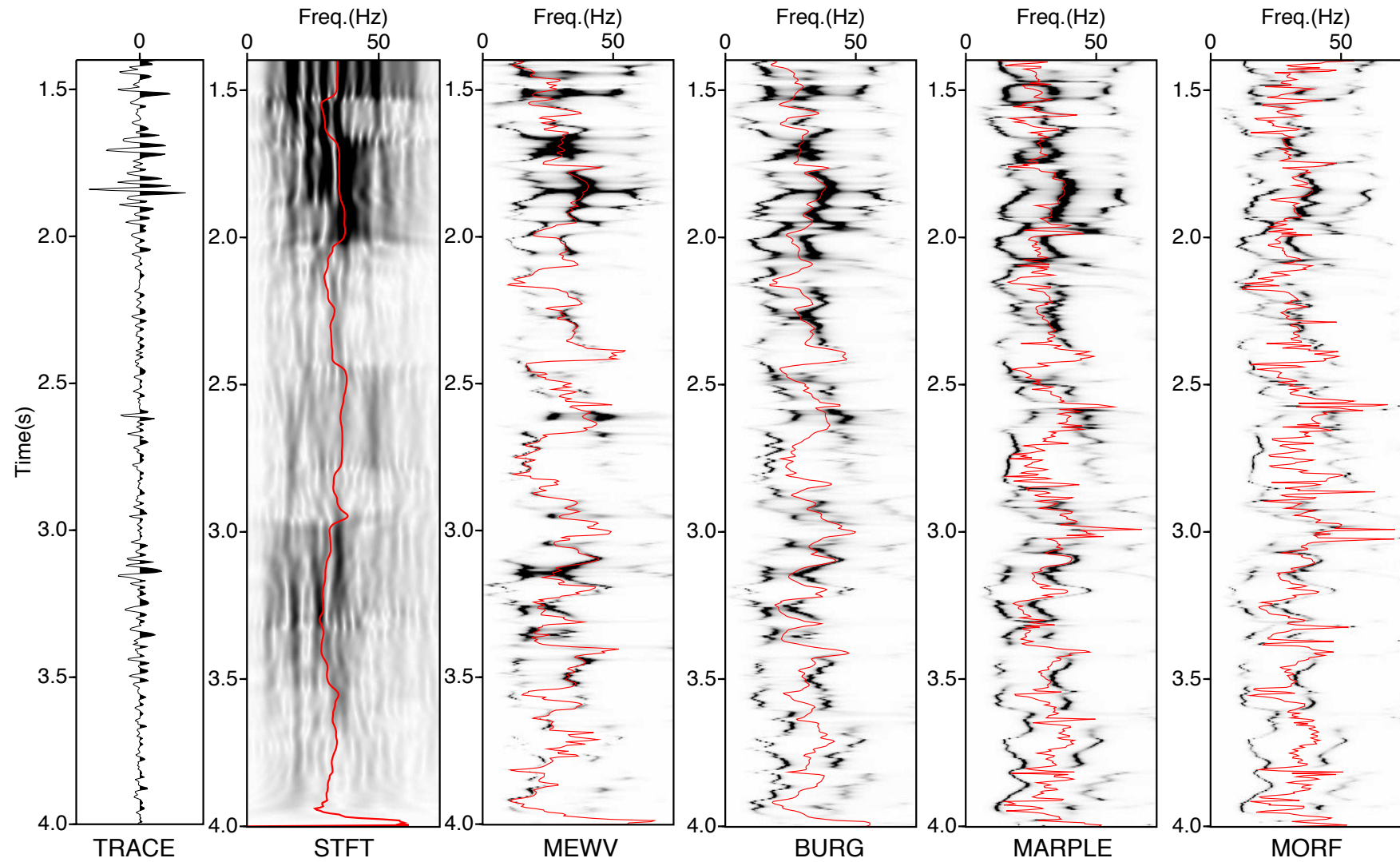
Marine Data, $L_w=3$, $L_c=1$



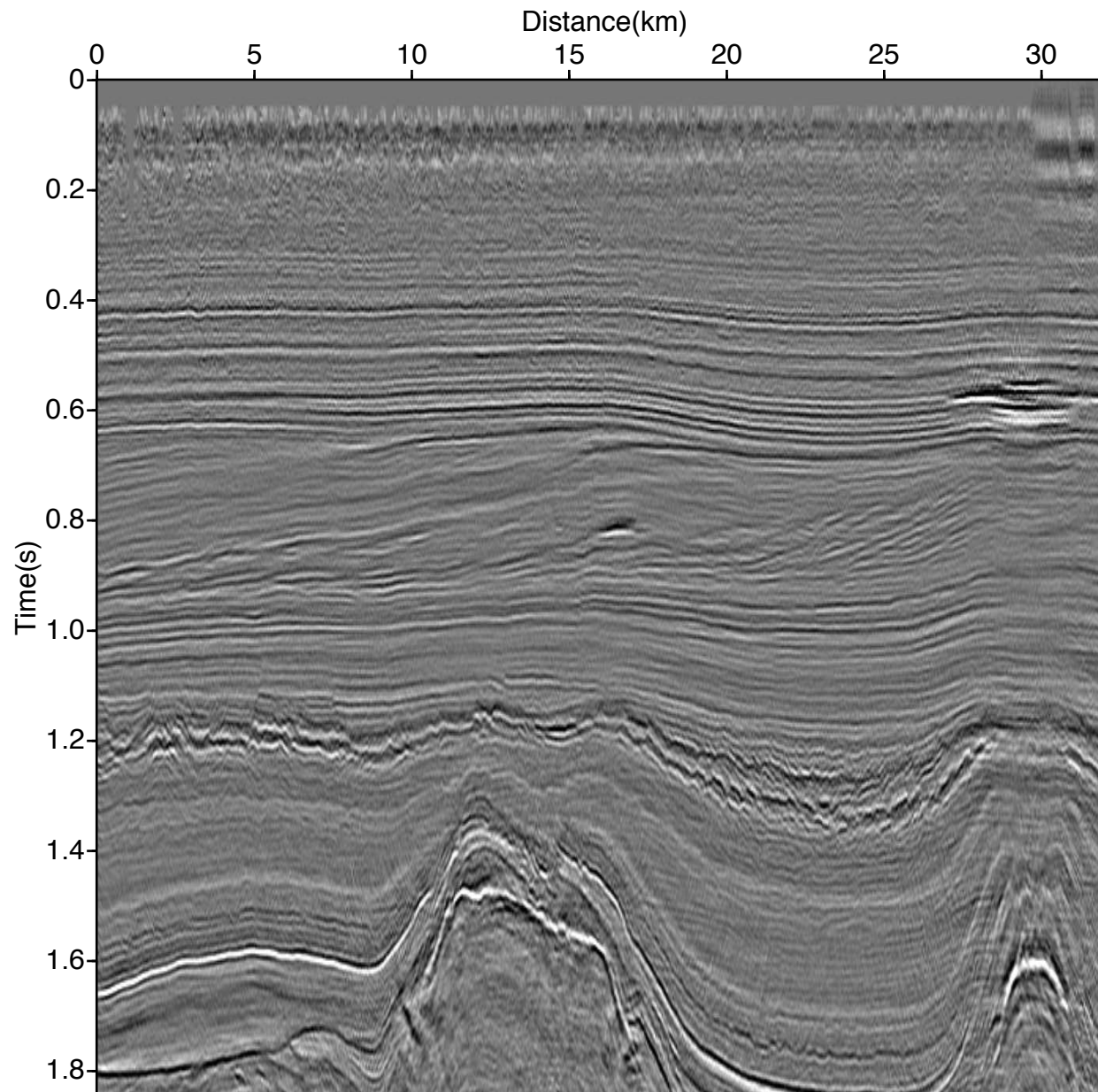
Marine Data, $L_w=5$, $L_c=1$



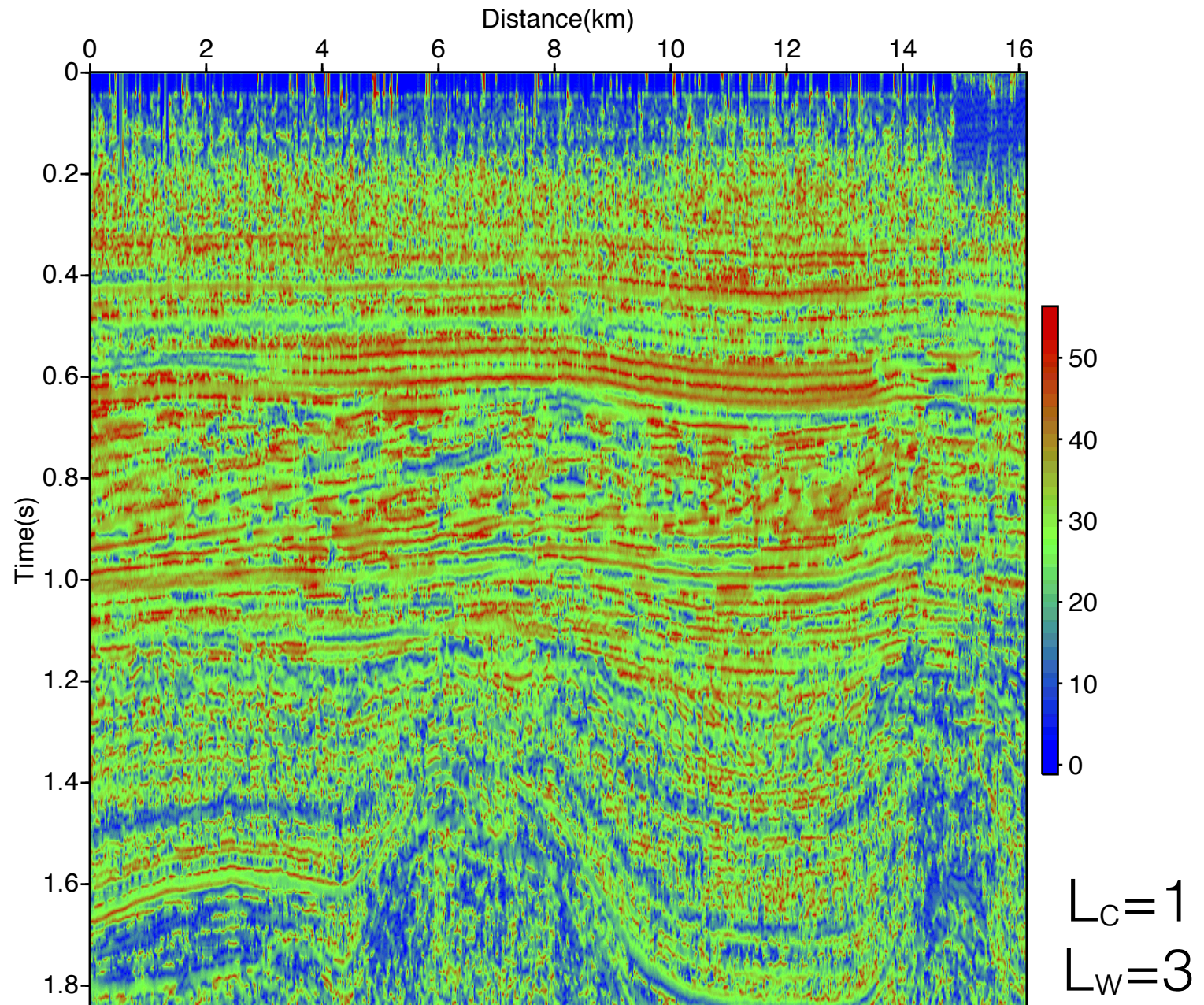
Marine Data, $L_w=13$, $L_c=3$



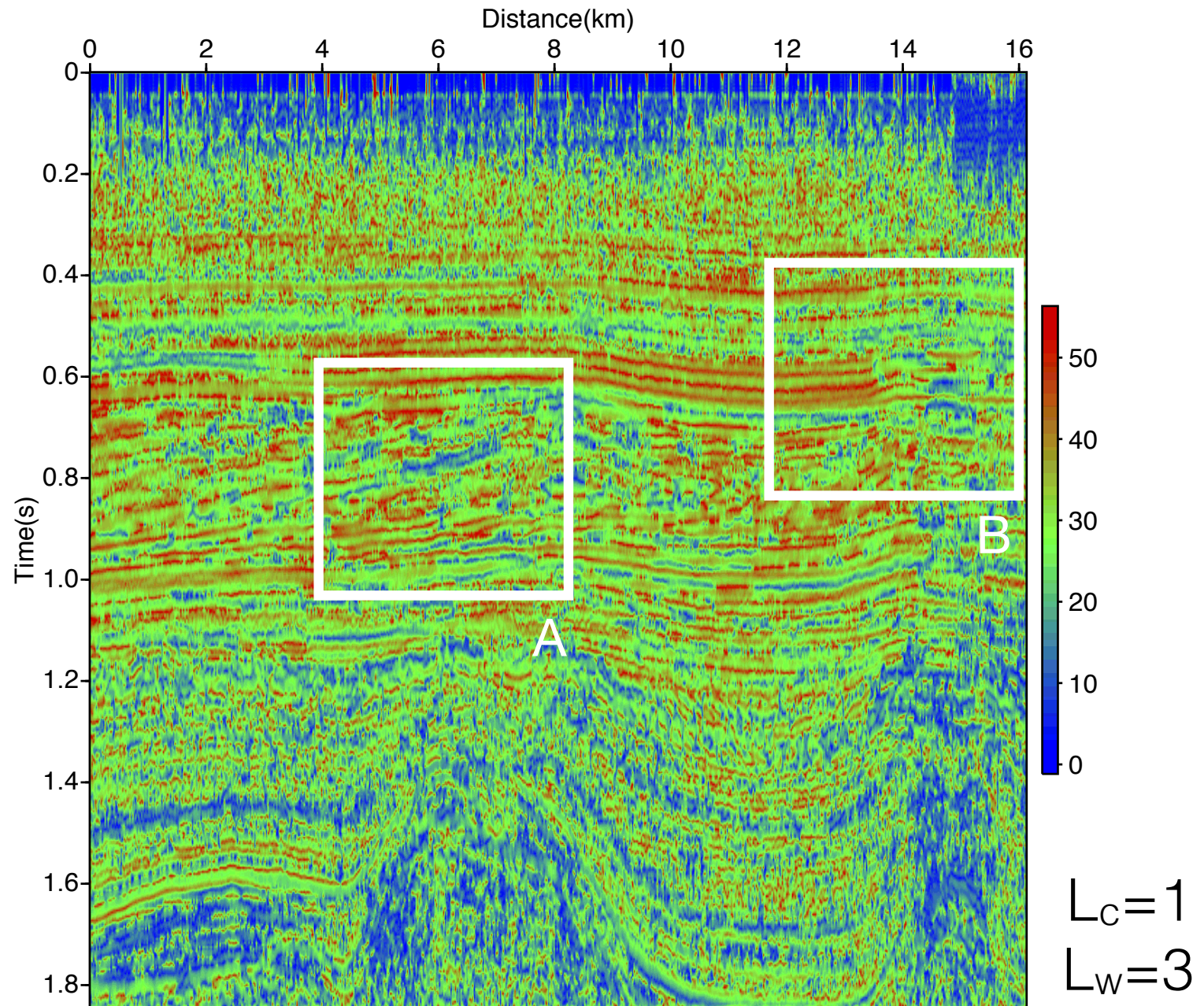
Marine Seismic Section



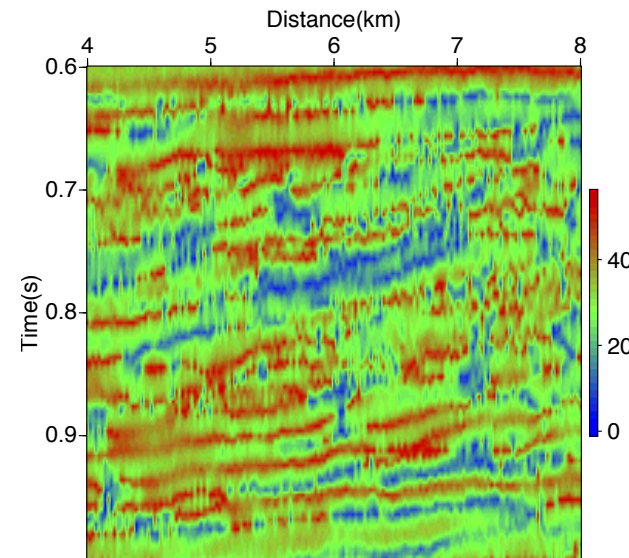
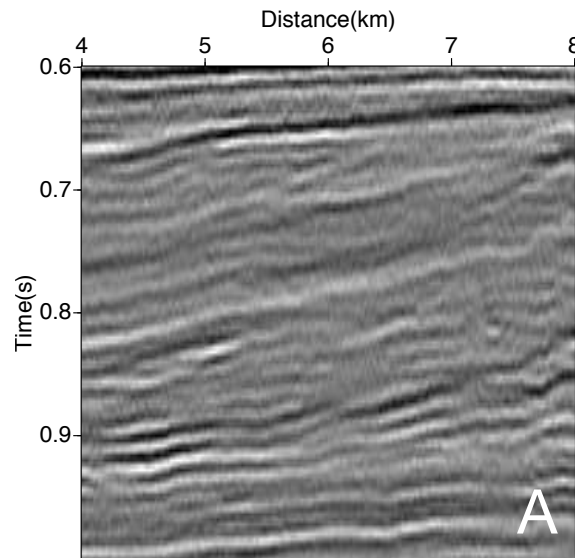
Frequency Field for Marine Seismic



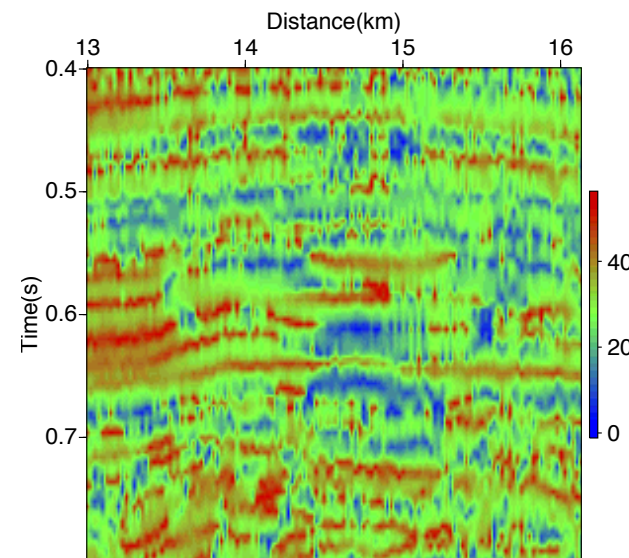
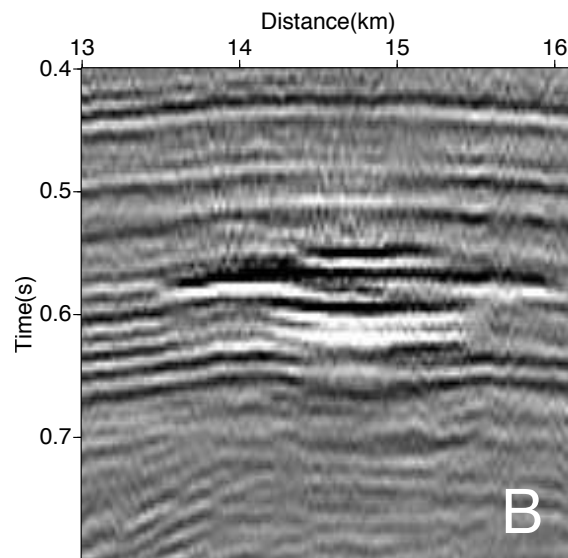
Frequency Field for Marine Seismic



Detail of Seismic Section

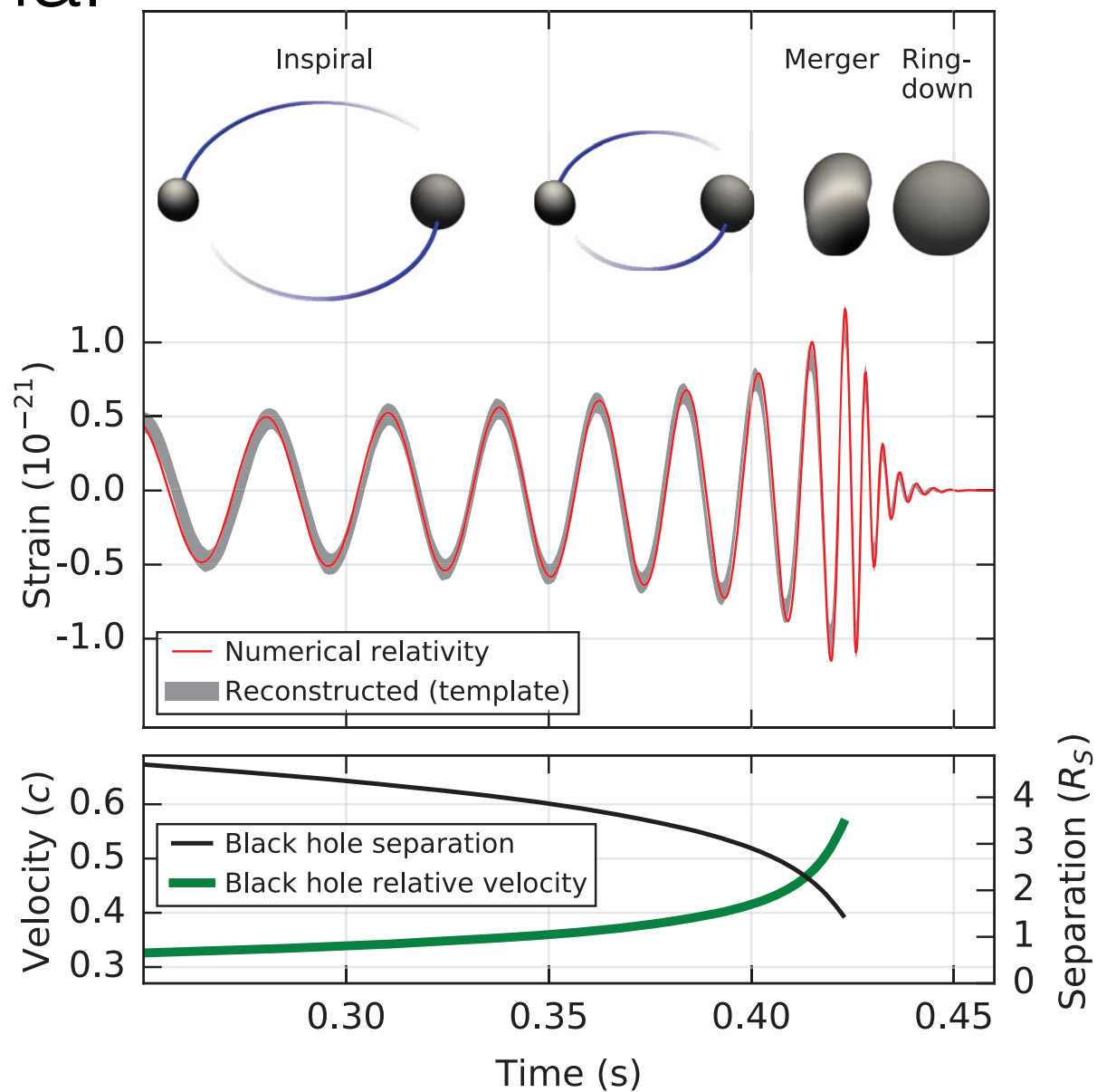


$L_C=1$
 $L_W=3$

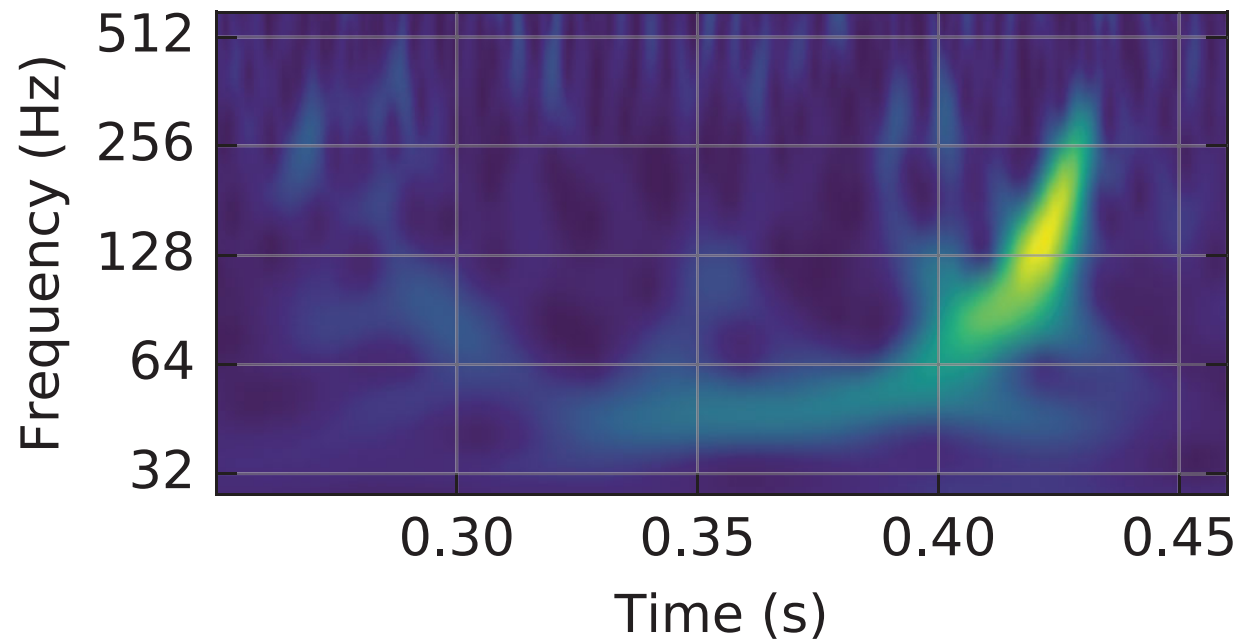
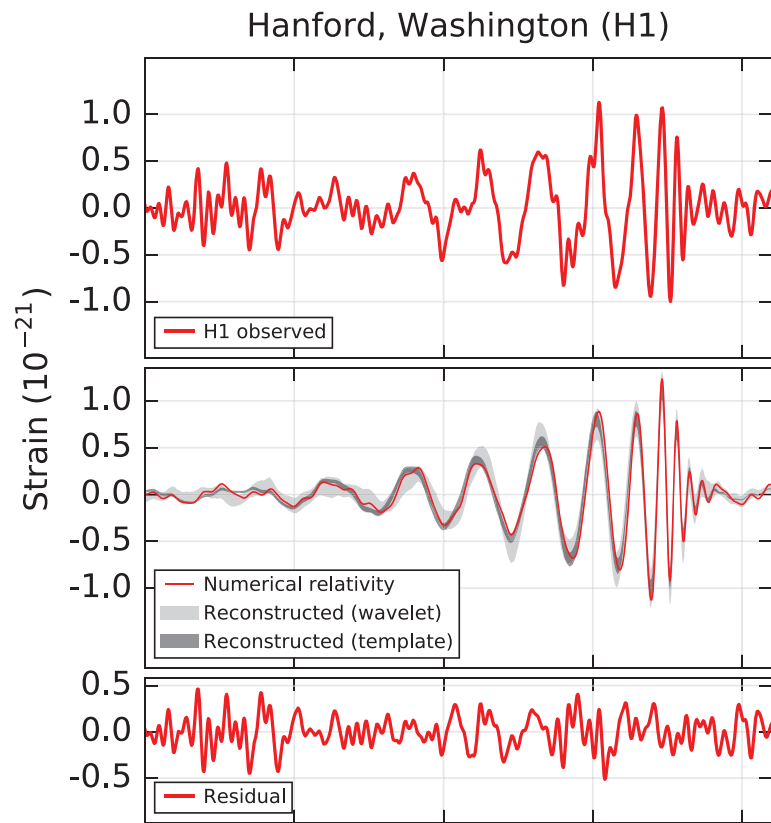


$L_C=1$
 $L_W=3$

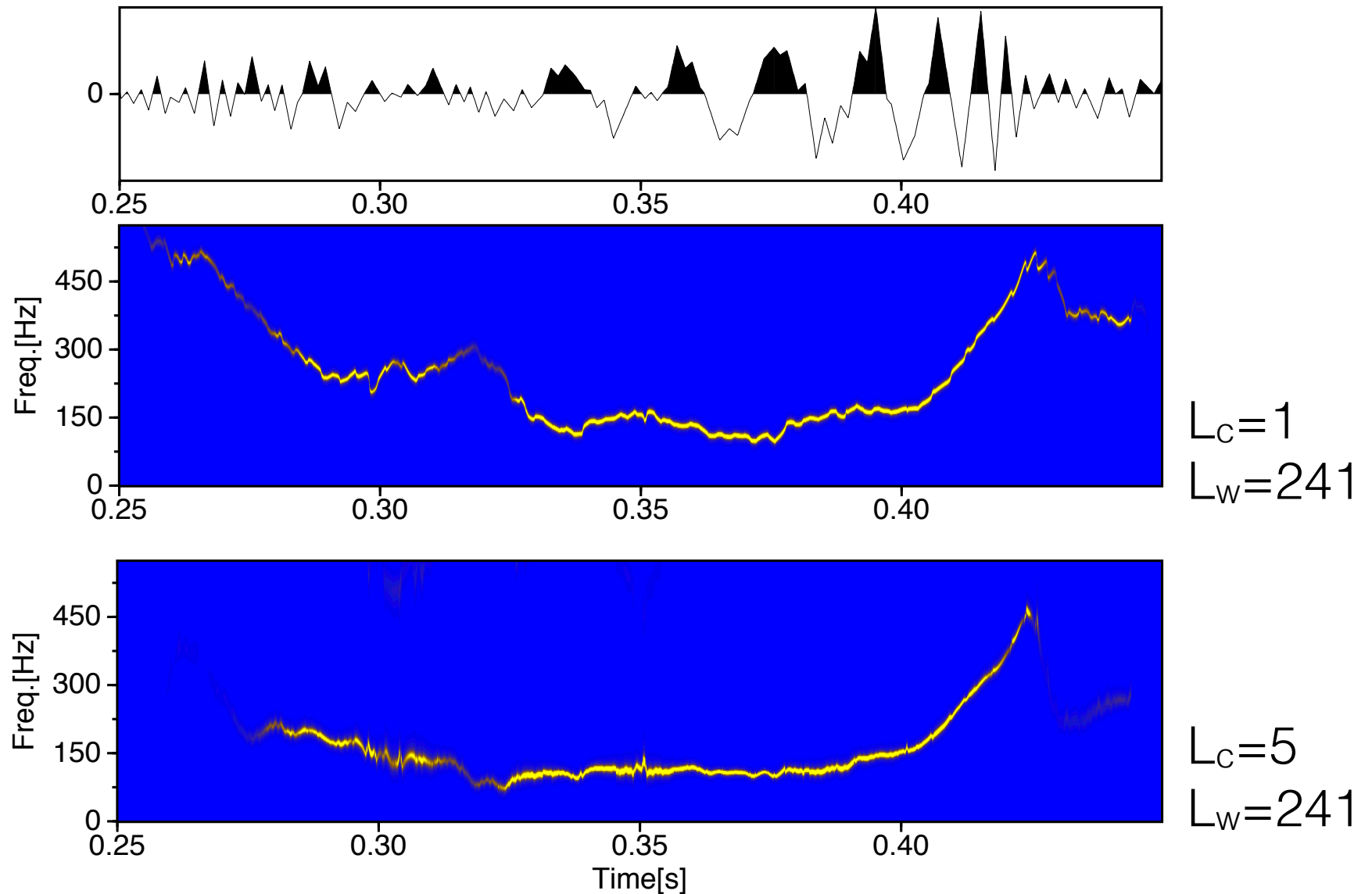
LIGO Gravitational Wave Model



LIGO Hanford data



Power Spectrum of LIGO Grav. Wave Detection with CSTAR



Conclusions

- CSTAR is a high-resolution method for time-frequency analysis;
- The Marple algorithm is recommended.
- Good results for:
 - ▶ Synthetic data,
 - ▶ Marine seismic data,
 - ▶ LIGO data.

Selected References

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