

# Physics Advanced Laboratory

FOURIER ANALYSIS – GRAVITATIONAL WAVES

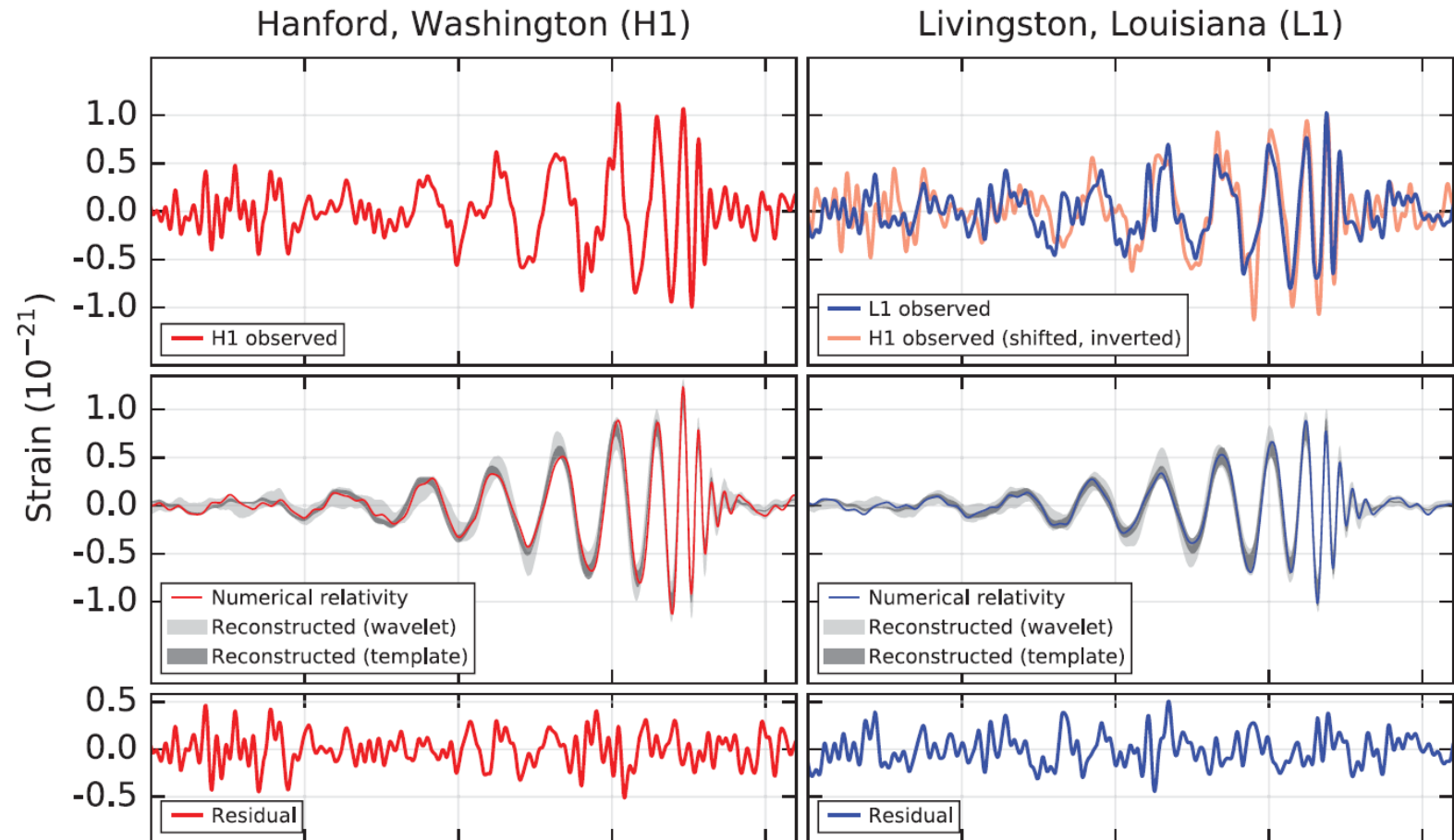
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# Outline

- ▶ Description of the experiment;
- ▶ Fourier Analysis: main tool to analyze data from the experiment;
- ▶ Identifying and removing noise;
- ▶ Correlation analysis;
- ▶ Analysis in a selected window;
- ▶ Conclusions.

# Gravitational Waves

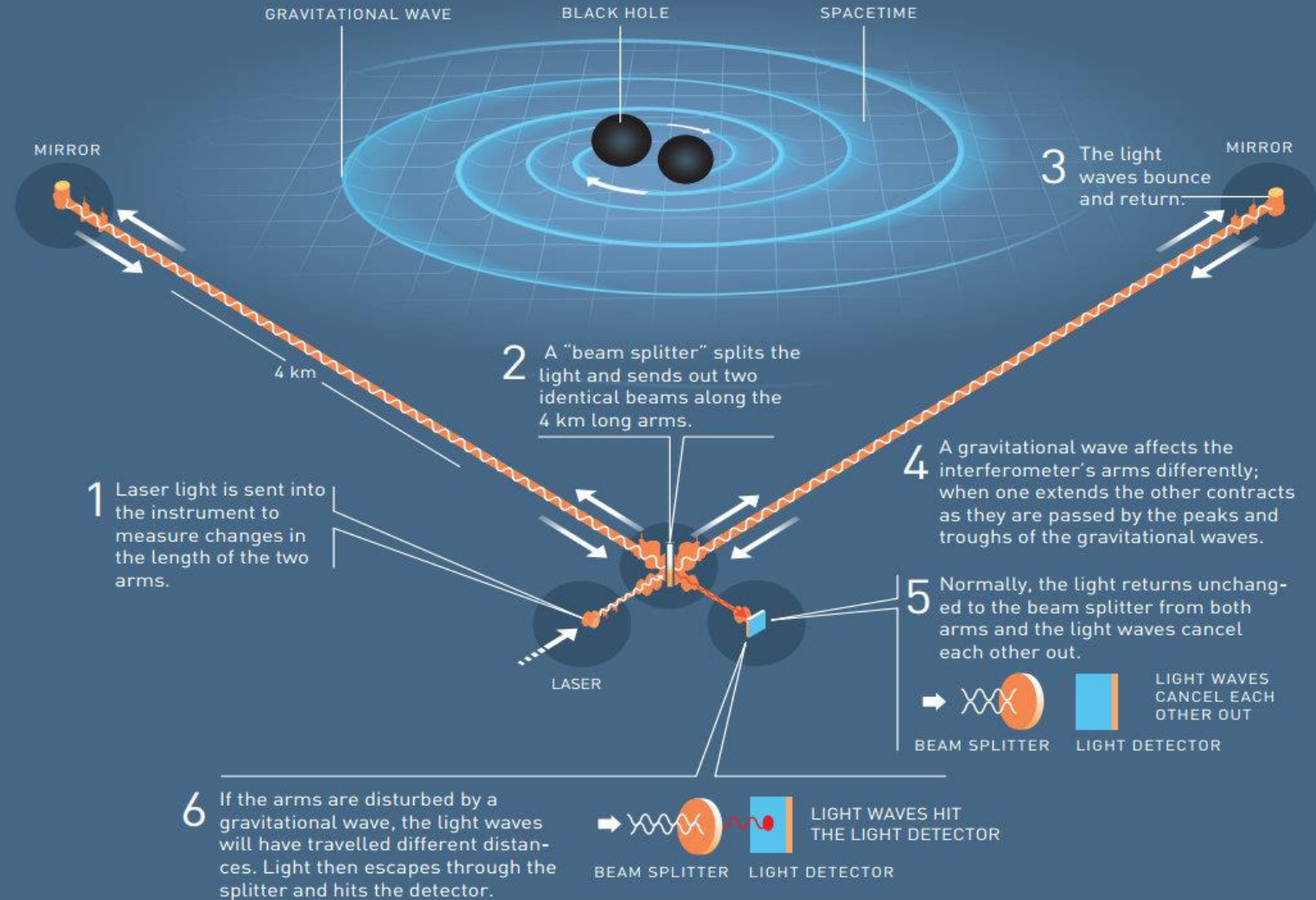
- ▶ Disturbances in the spacetime curvature;
- ▶ Generated by the merger of two black holes;
- ▶ Strain:  $\sim 10^{-21}$



# Gravitational Waves:

How can we "see" them?

## LIGO – A GIGANTIC INTERFEROMETER



# Fourier Analysis

1. Tool for decomposing a signal into periodic components (sines and cosines) and recover it from those components.
  - ▶ Allow us to decompose signal in components characterized by a different choice of frequencies, ex. noise in high frequencies.
  - ▶ Signal  $x[n]$  is discrete, given only in  $N$  sampling times  $n\Delta t$ , over a period  $T$ : need to use Discrete Fourier Transform

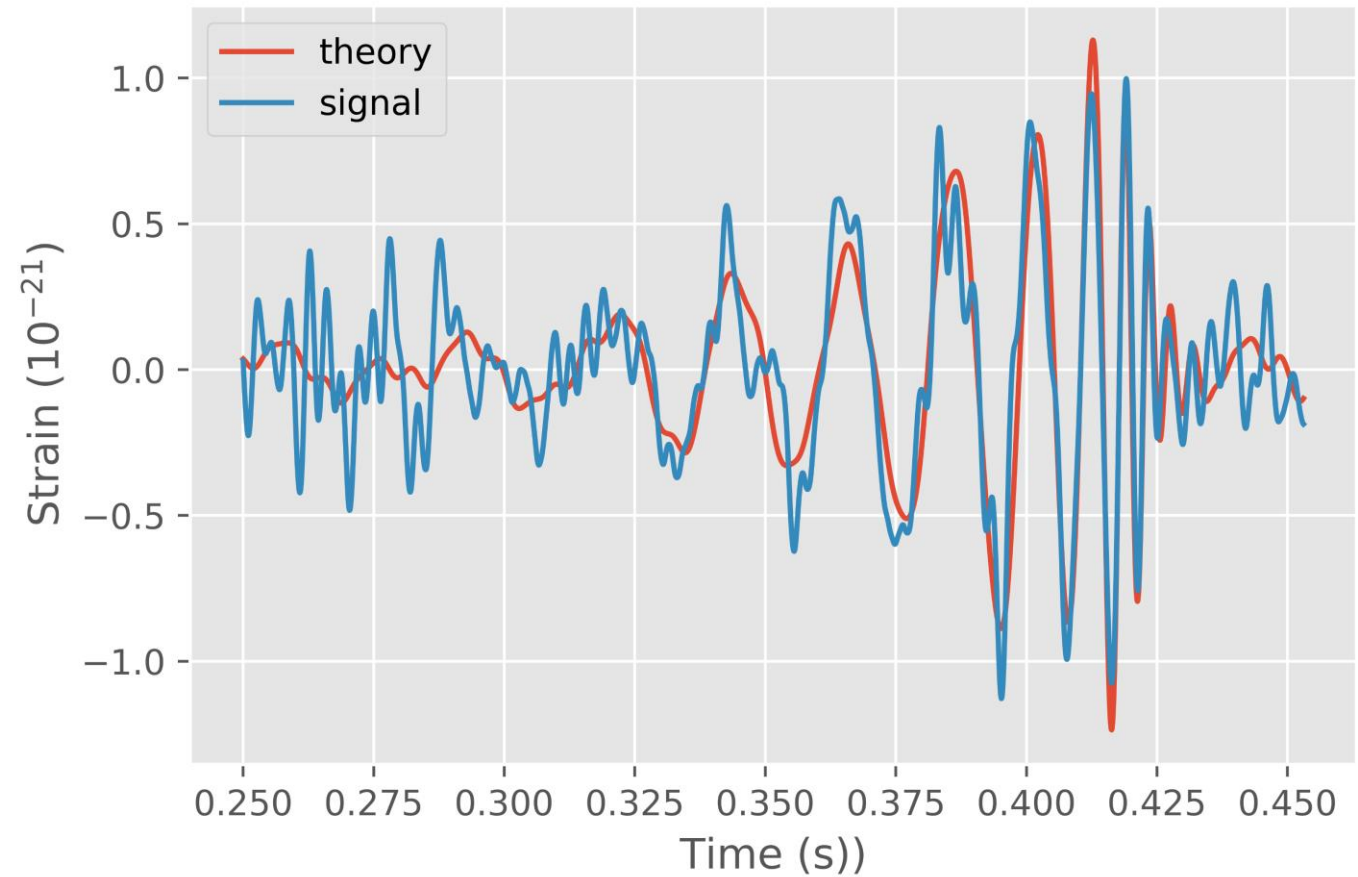
$$x(t) = \sum_{k=-\infty}^{\infty} y_k e^{i\frac{2\pi kt}{T}} \longrightarrow x[n] = \frac{1}{N} \sum_{k=0}^{N-1} e^{2\pi i \frac{kn}{N}} y[k]$$

$$y_k = \frac{1}{T} \int_{-\frac{T}{2}}^{\frac{T}{2}} e^{-i\frac{2\pi kt}{T}} x(t) dt \longrightarrow y[k] = \sum_{n=0}^{N-1} e^{-2\pi i \frac{kn}{N}} x[n]$$

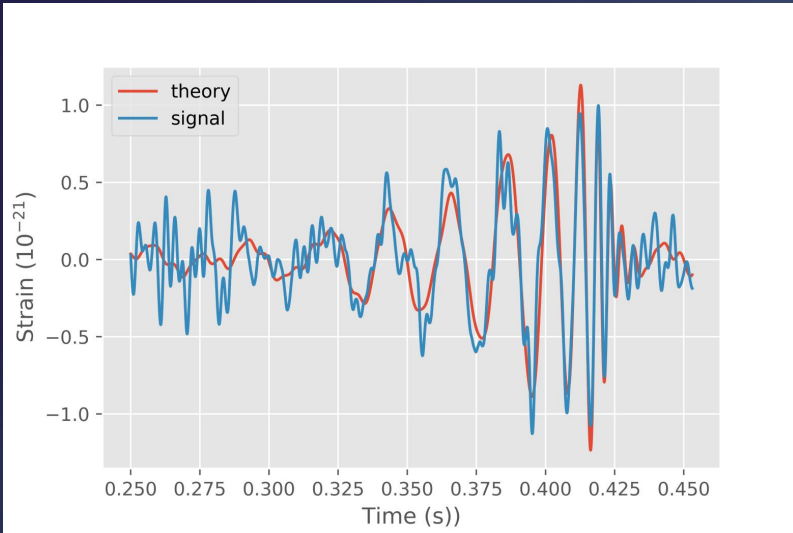
$$i\frac{2\pi}{T}kt \rightarrow i\frac{2\pi}{N\Delta t}kn\Delta t \rightarrow 2\pi i \frac{kn}{N}$$

# Gravitational Waves: Theory vs Experiment

- ▶ Analysis of the correlation between theory (expected signal) and observation (actual signal)
- ▶ Analysis of the correlation between residue and observation

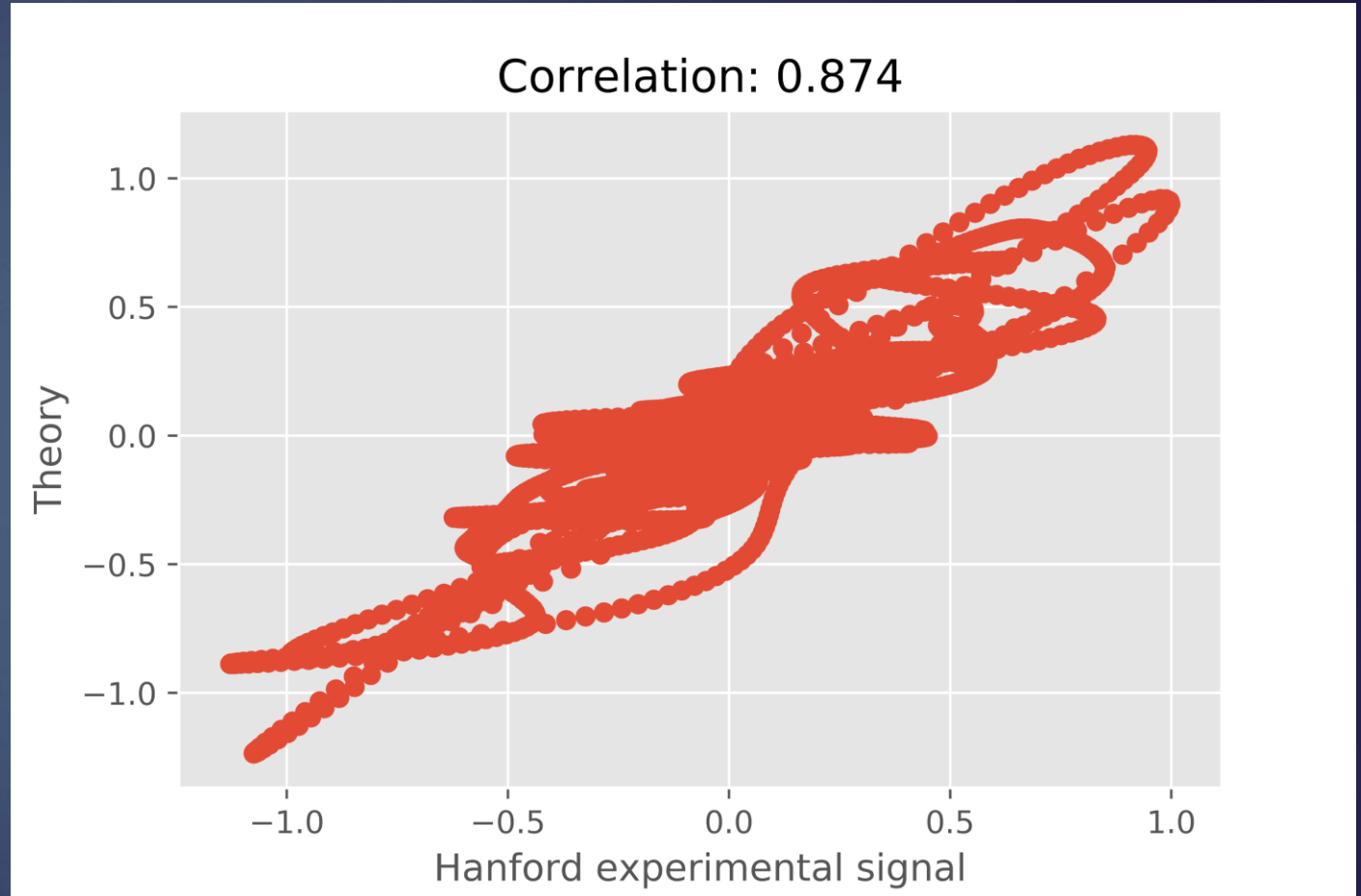


# Gravitational Waves theory vs observation



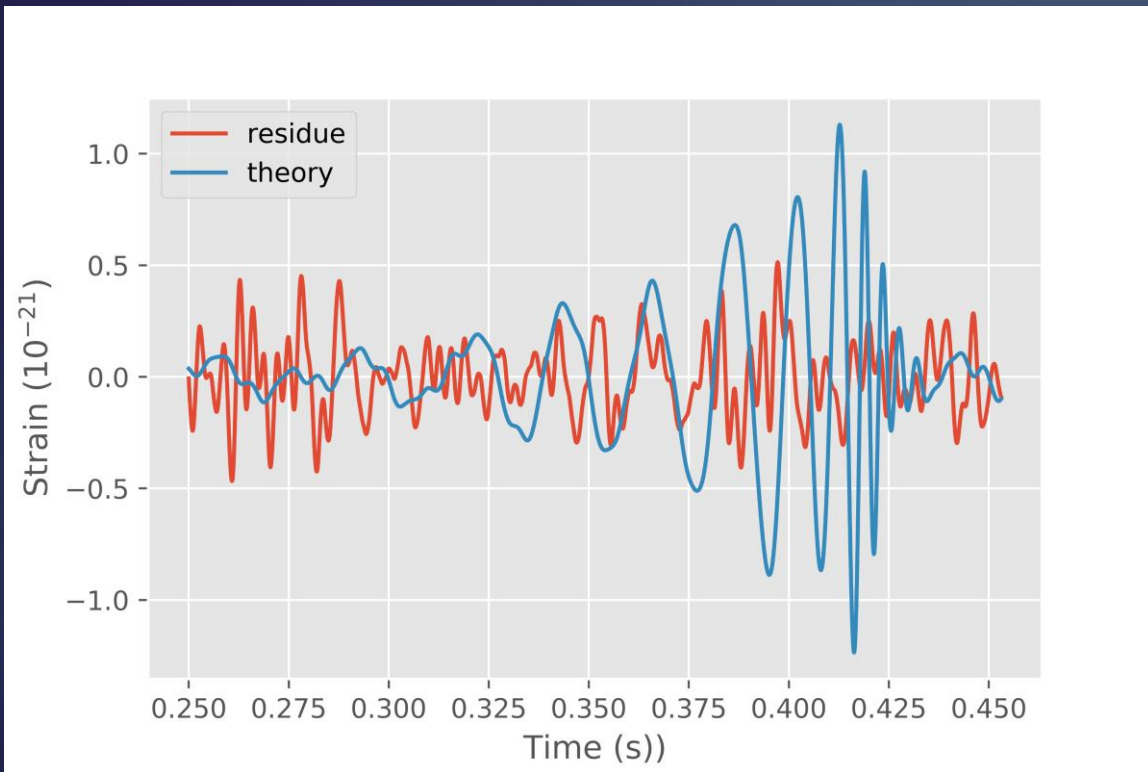
Pearson correlation coefficient

$$r_{xy} = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{\sqrt{\sum_{i=1}^n (x_i - \bar{x})^2} \sqrt{\sum_{i=1}^n (y_i - \bar{y})^2}}$$

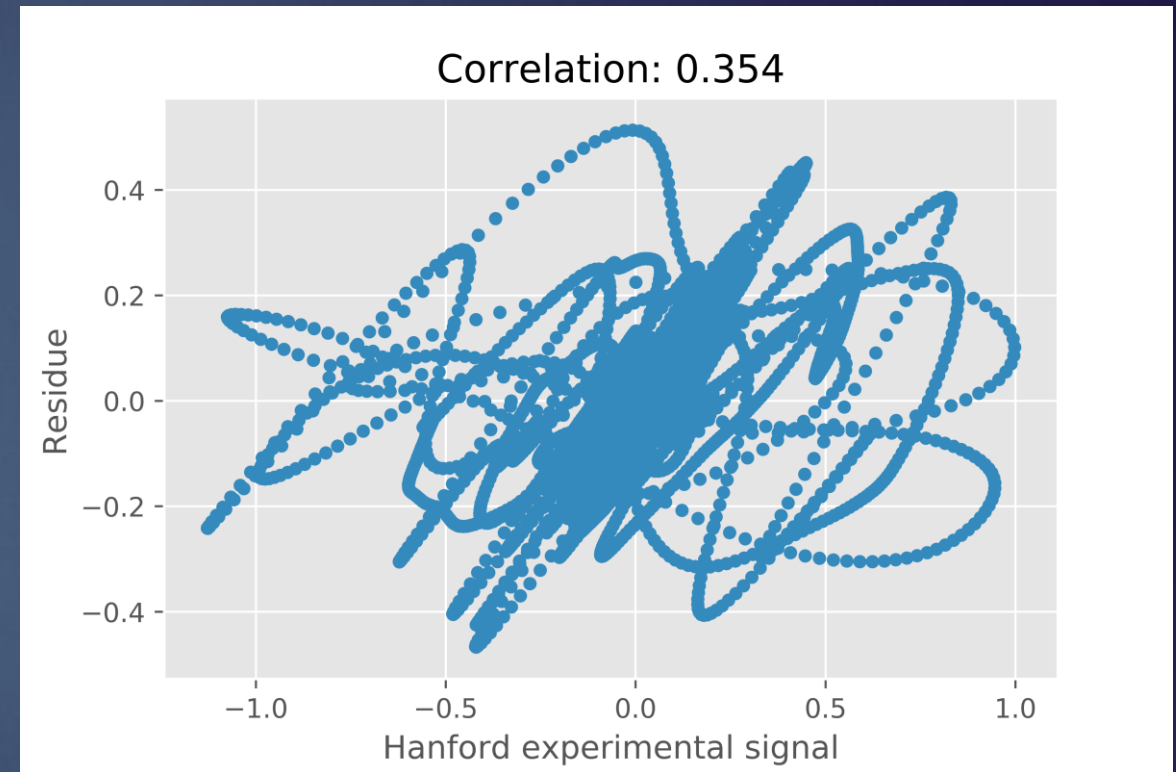


# Residues: difference between signal and theory

8



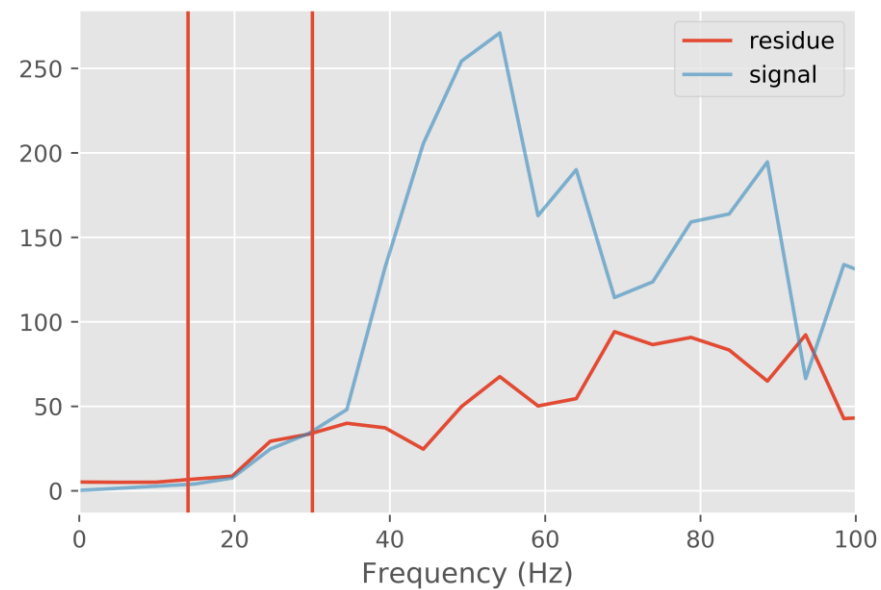
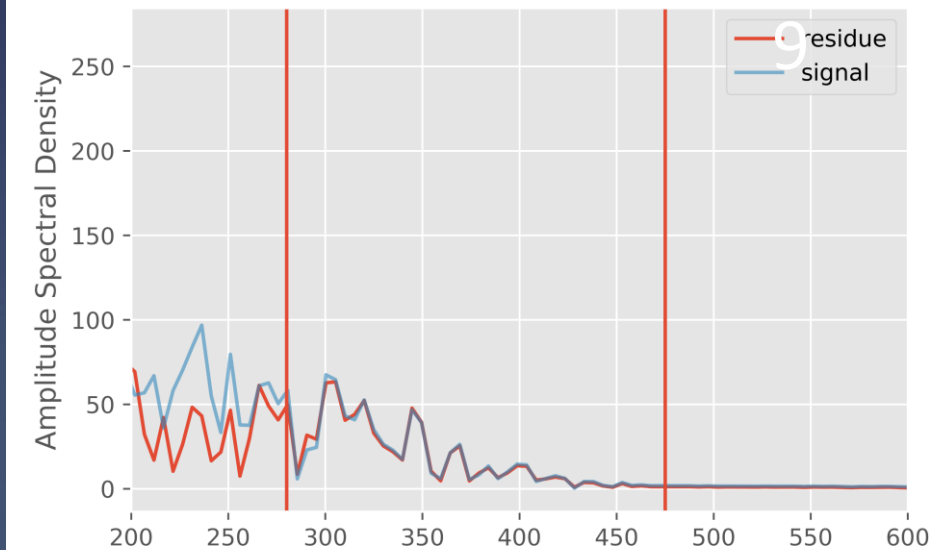
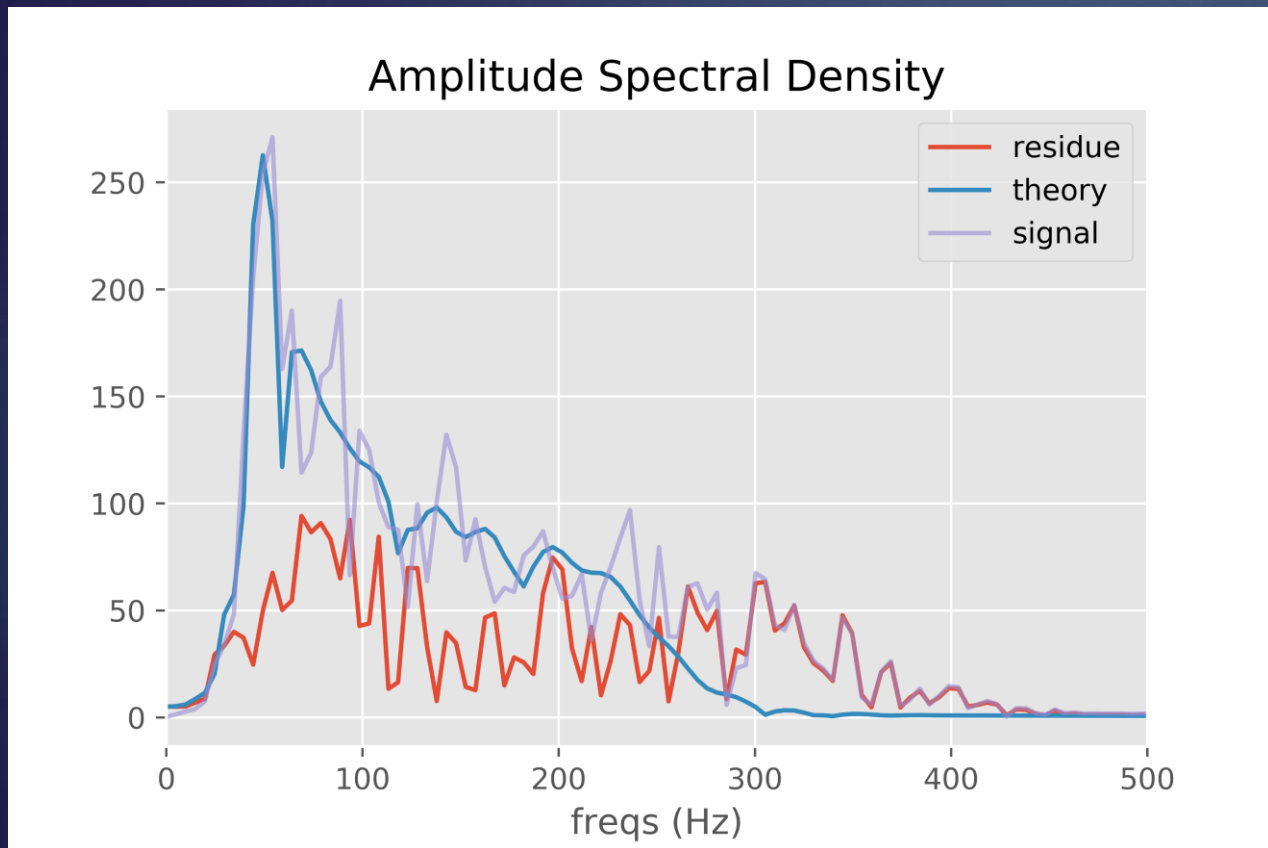
Residue varies too much in amplitude (contains more than noise)



Some correlation between residue and signal: where signal is not expected, actual signal could be pure noise (ex: high frequencies)



# Fourier Transforms: finding noise (raw windows)

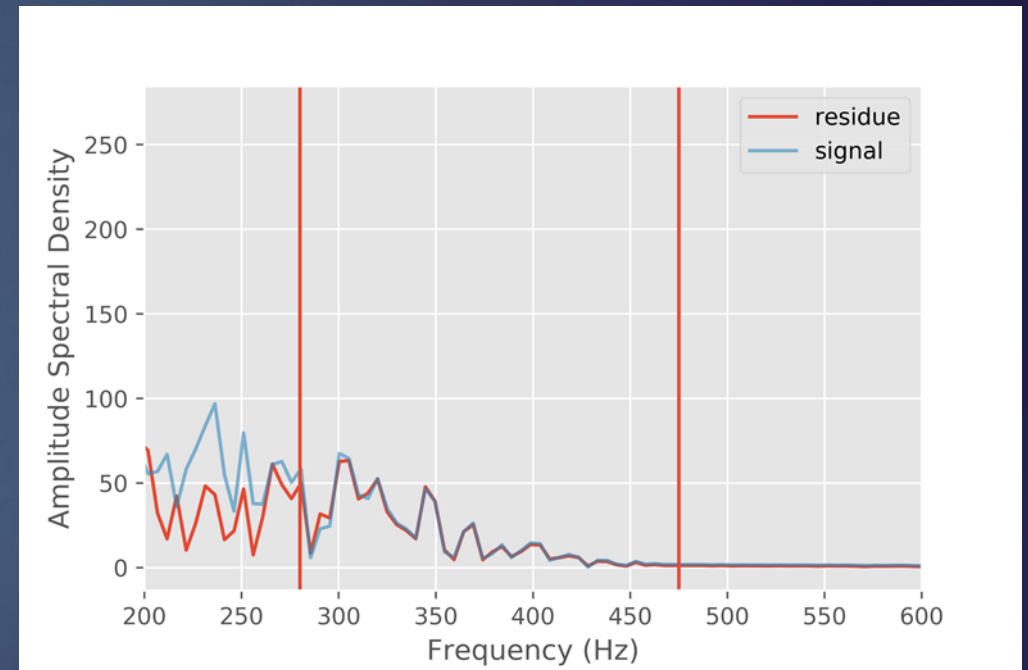


# Optimizing the extraction of noise

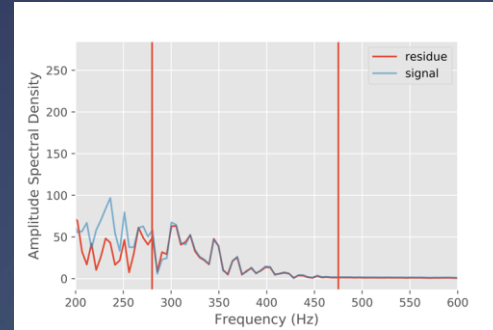
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## Procedure

- ▶ Departing from crude estimates for the limits of frequency window, search methodically for values that give the best fit for Residue = Signal
- ▶ For the cases where the fit is almost perfect (slope  $> 0.99$ ; intercept  $\sim 0$ ), find the larger window.



# Optimizing the extraction of noise results



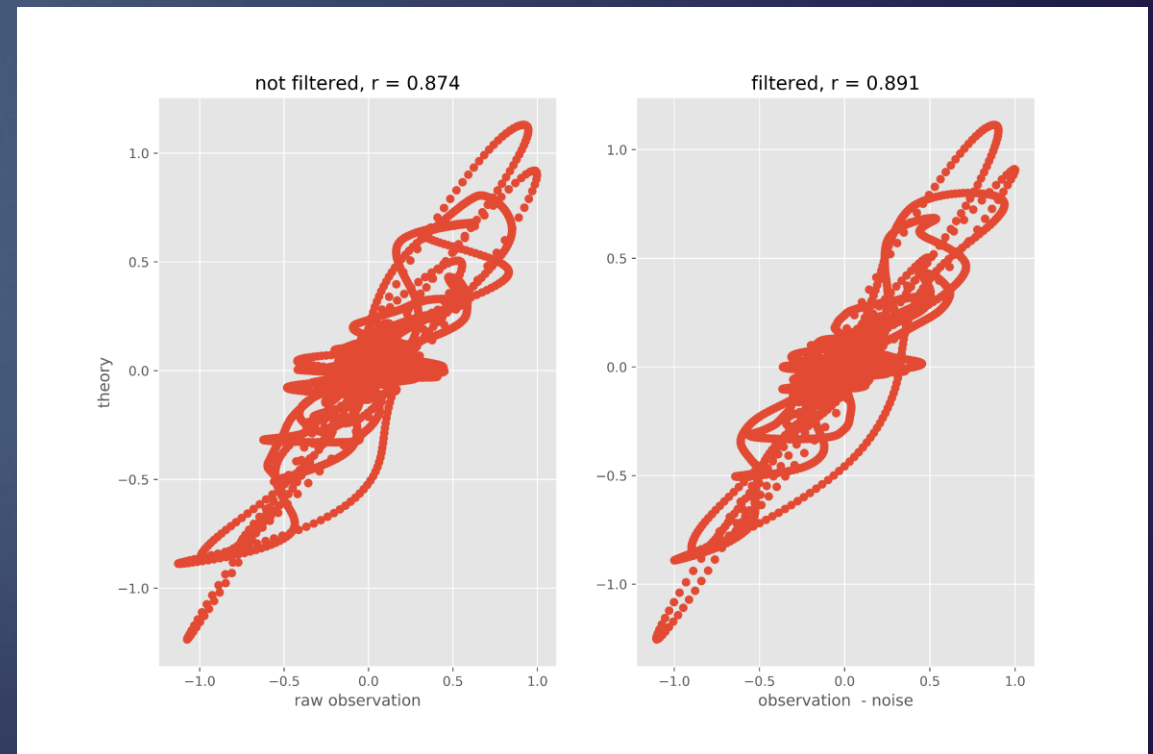
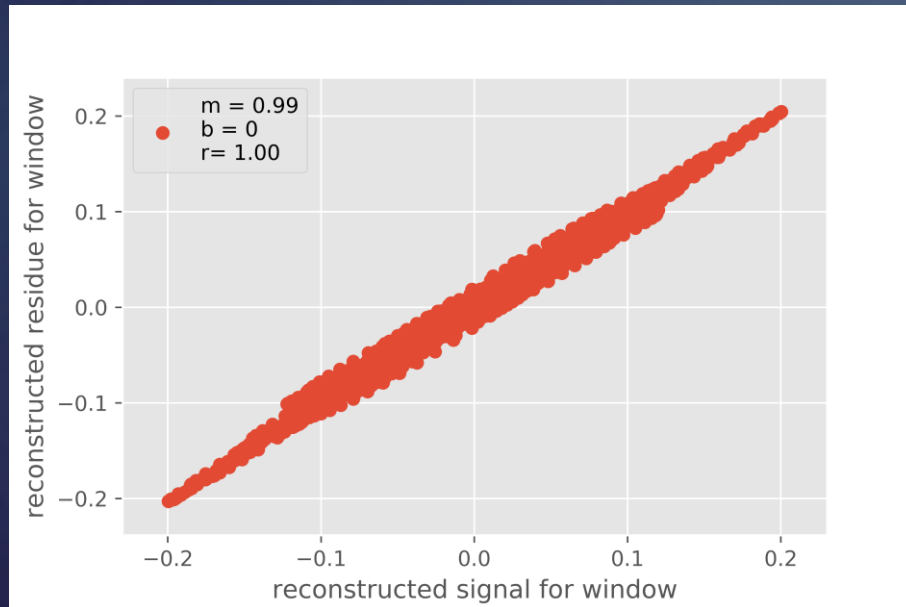
Correlation:

0.874



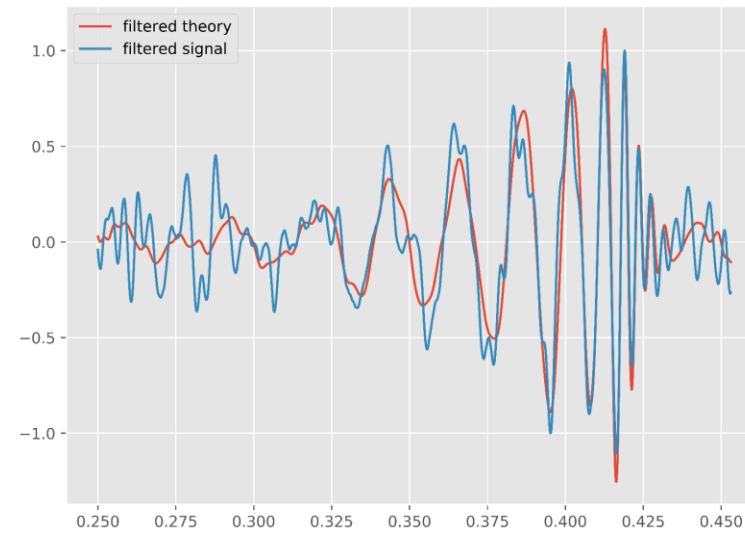
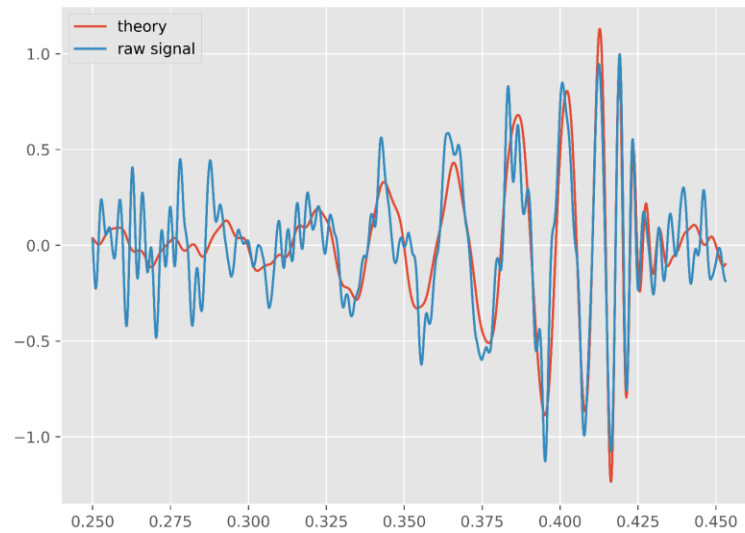
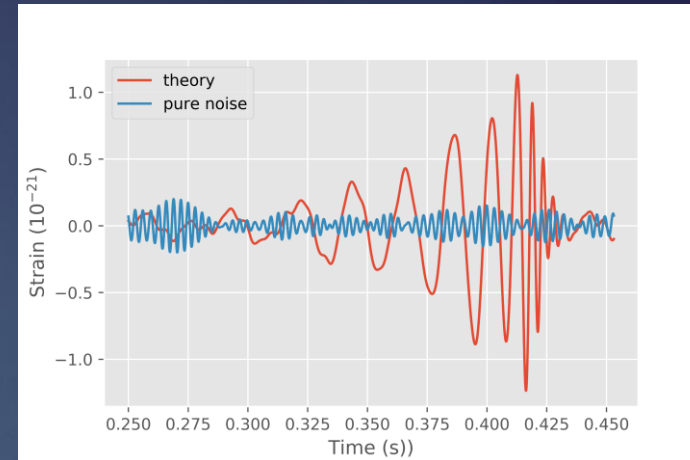
0.891

High frequencies window :  
286 Hz - 398 Hz



# Before and After

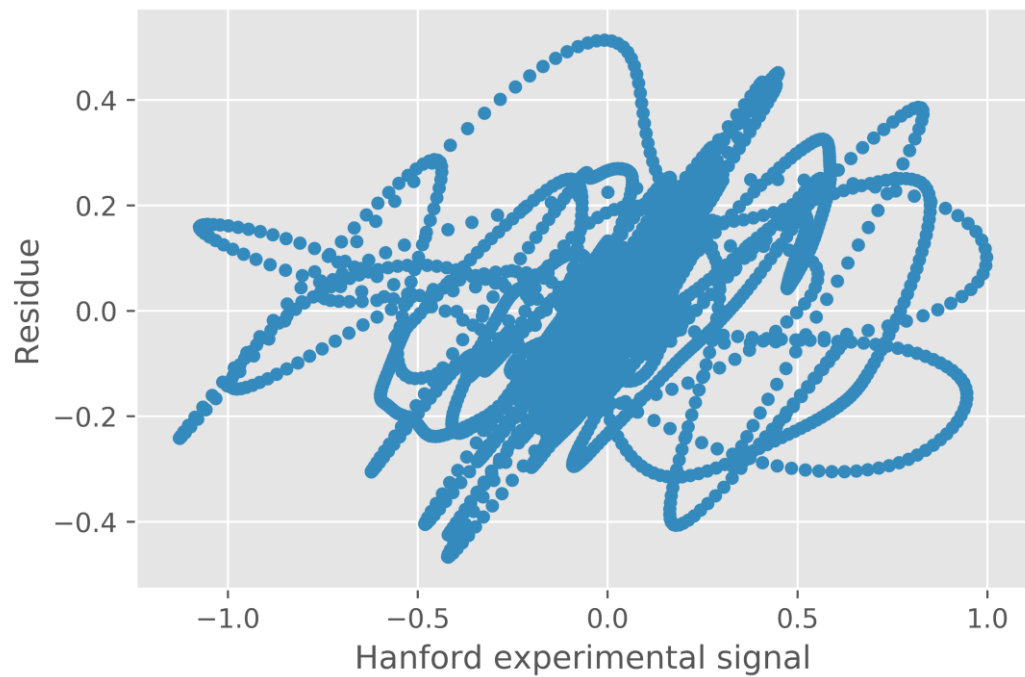
Mostly attenuation of spiky behavior in the signal



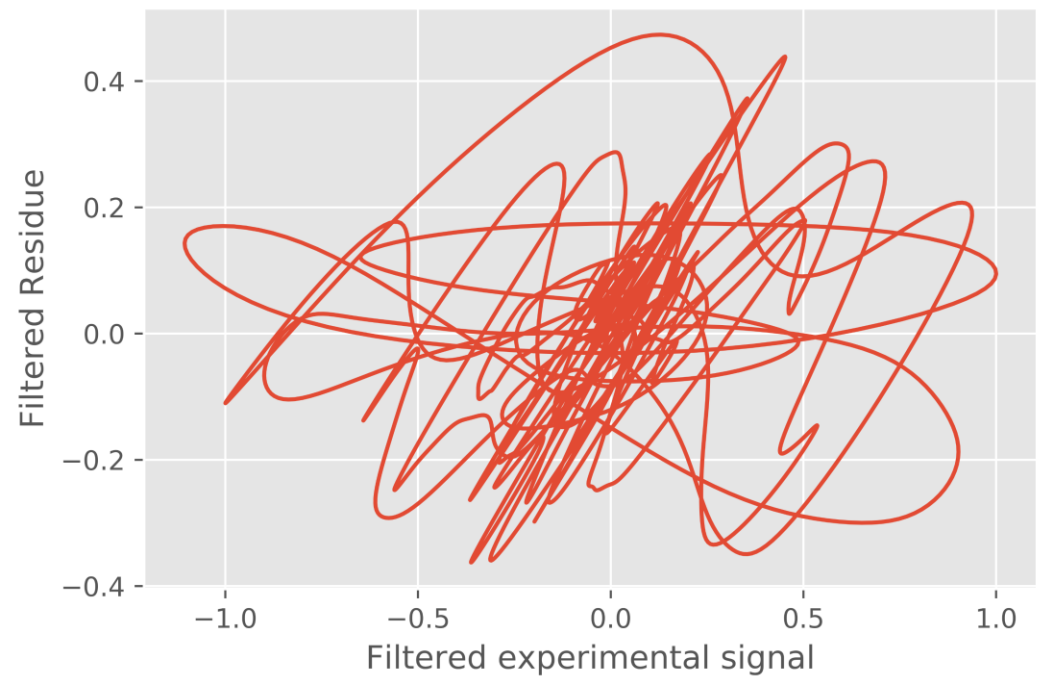
# Residue vs Signal

Before and after removing high frequency noise

Correlation: 0.354

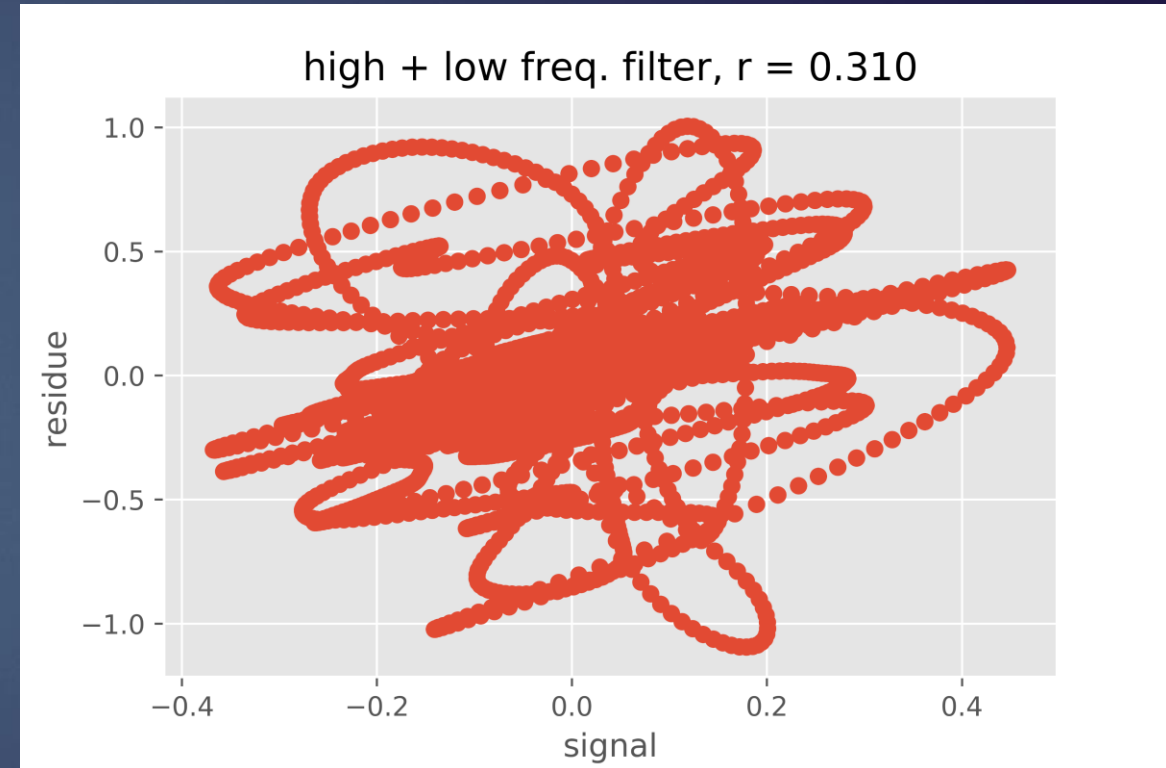
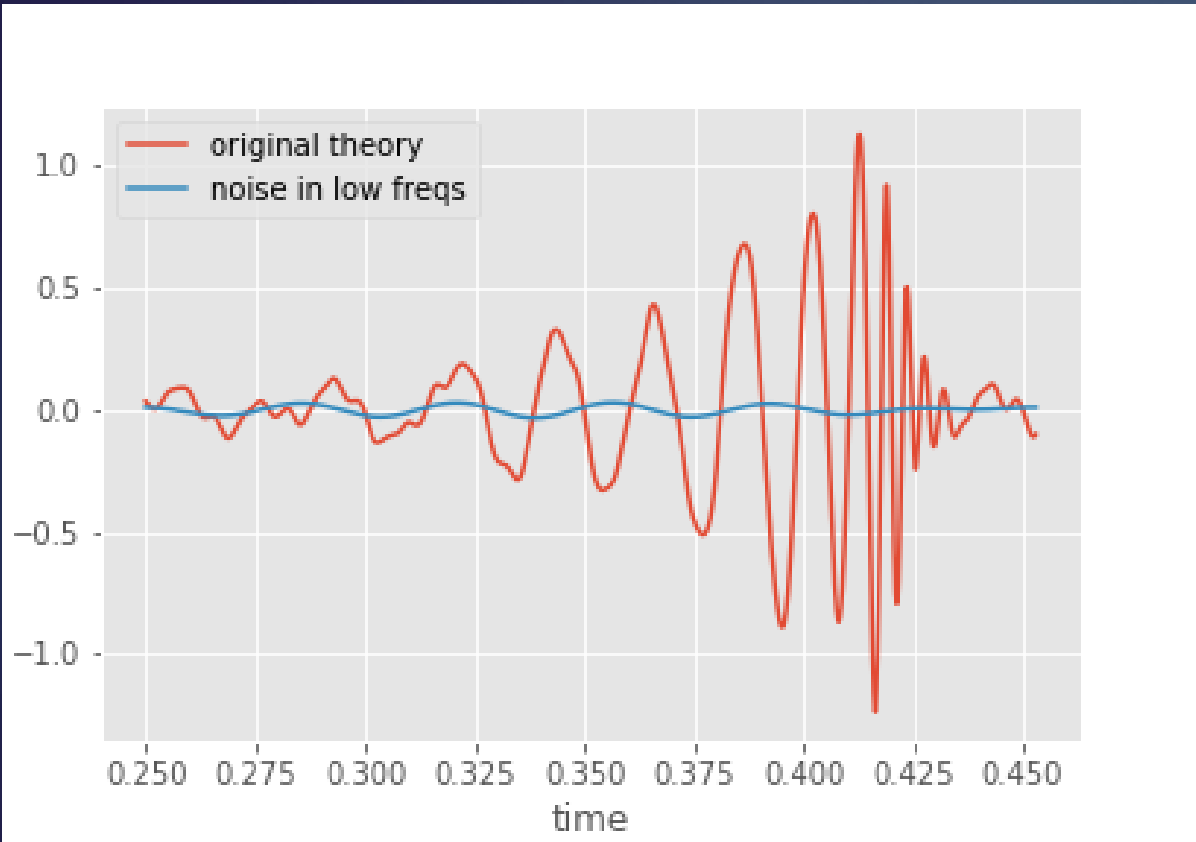


Correlation: 0.309



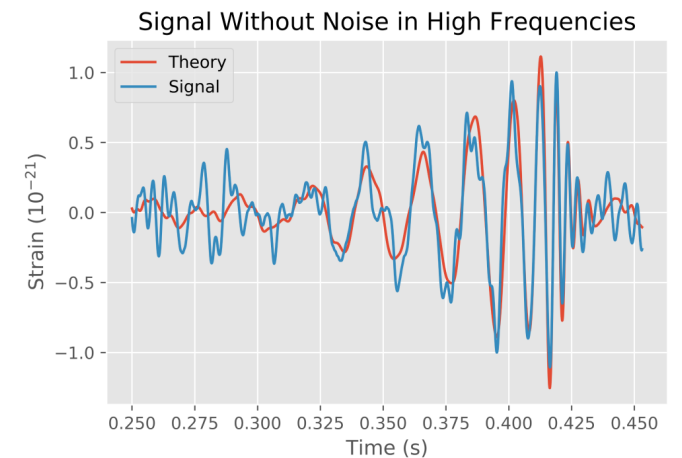
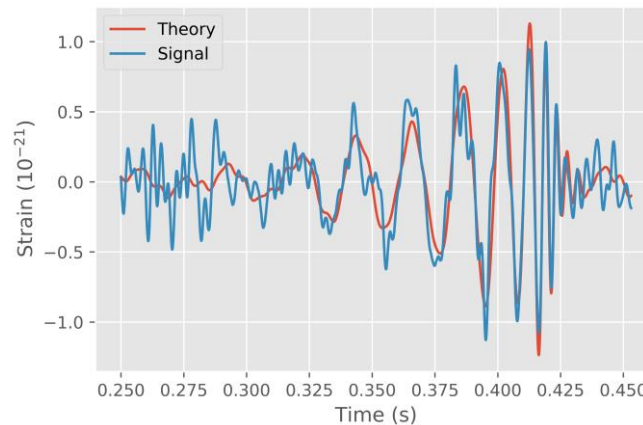
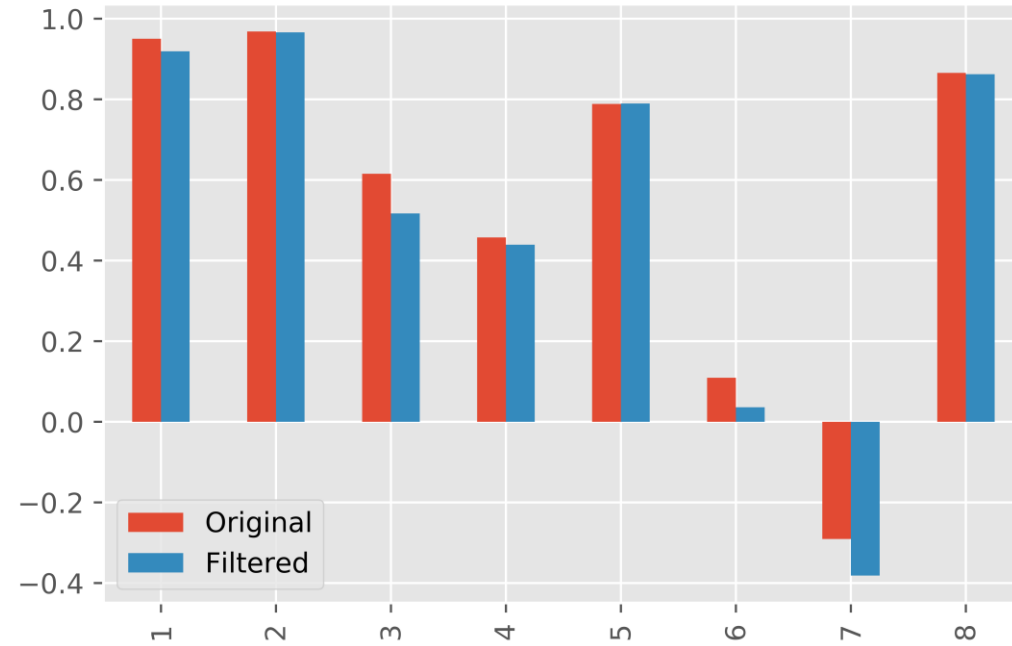
# Low frequencies noise

correlation residue/signal actually increases



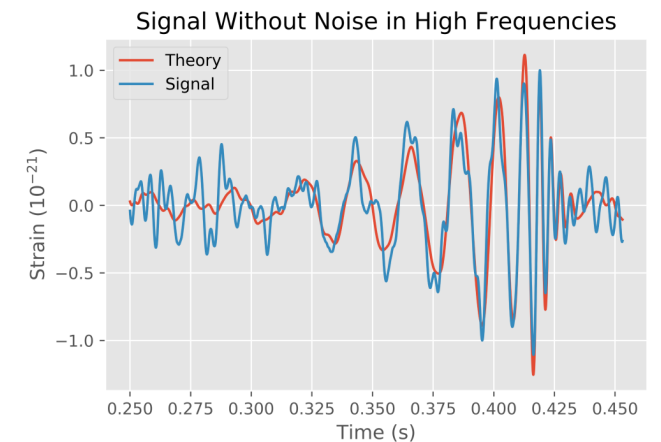
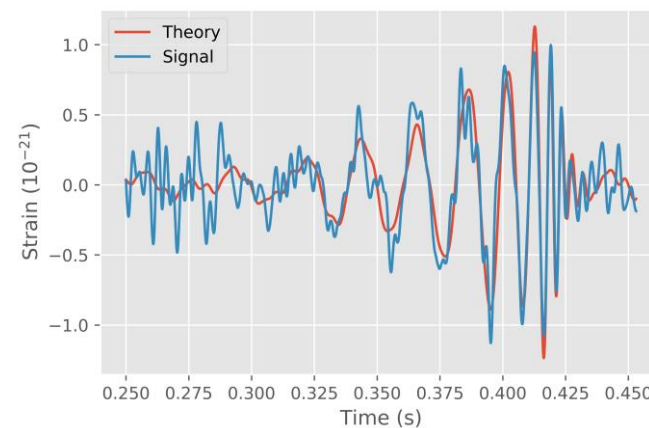
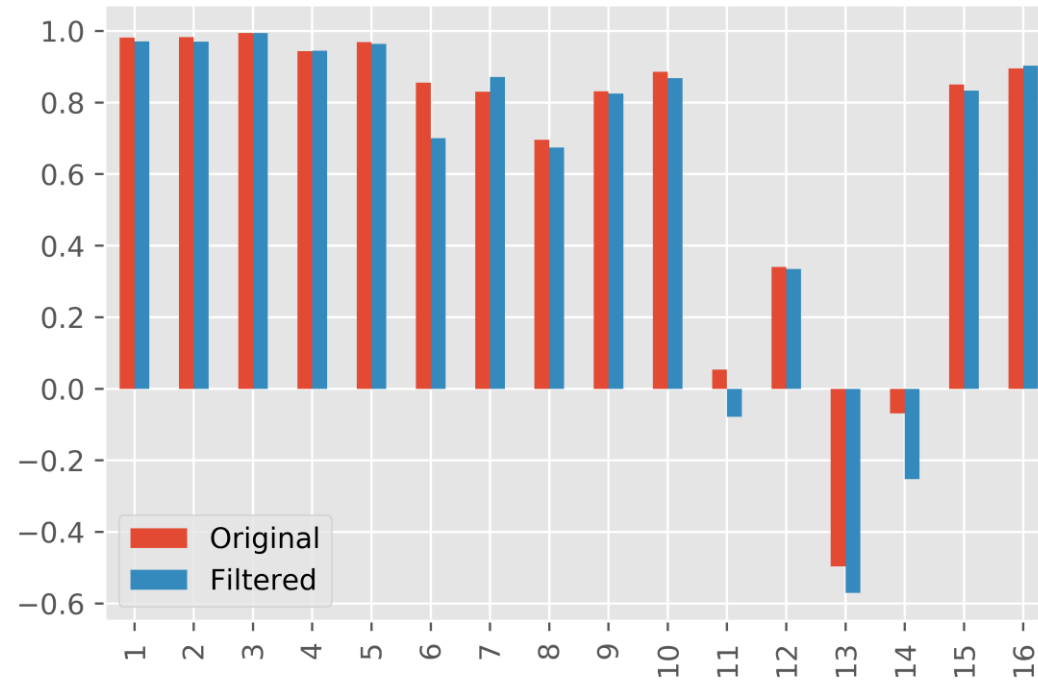
# Correlation Analysis

- ▶ 1, 2 & 8 – low amplitudes, theory is almost zero
- ▶ 3 & 4 – correlation decreases
- ▶ 5 – high correlation
- ▶ 7 – negative correlation; filtered has bigger correlation



# Correlation Analysis

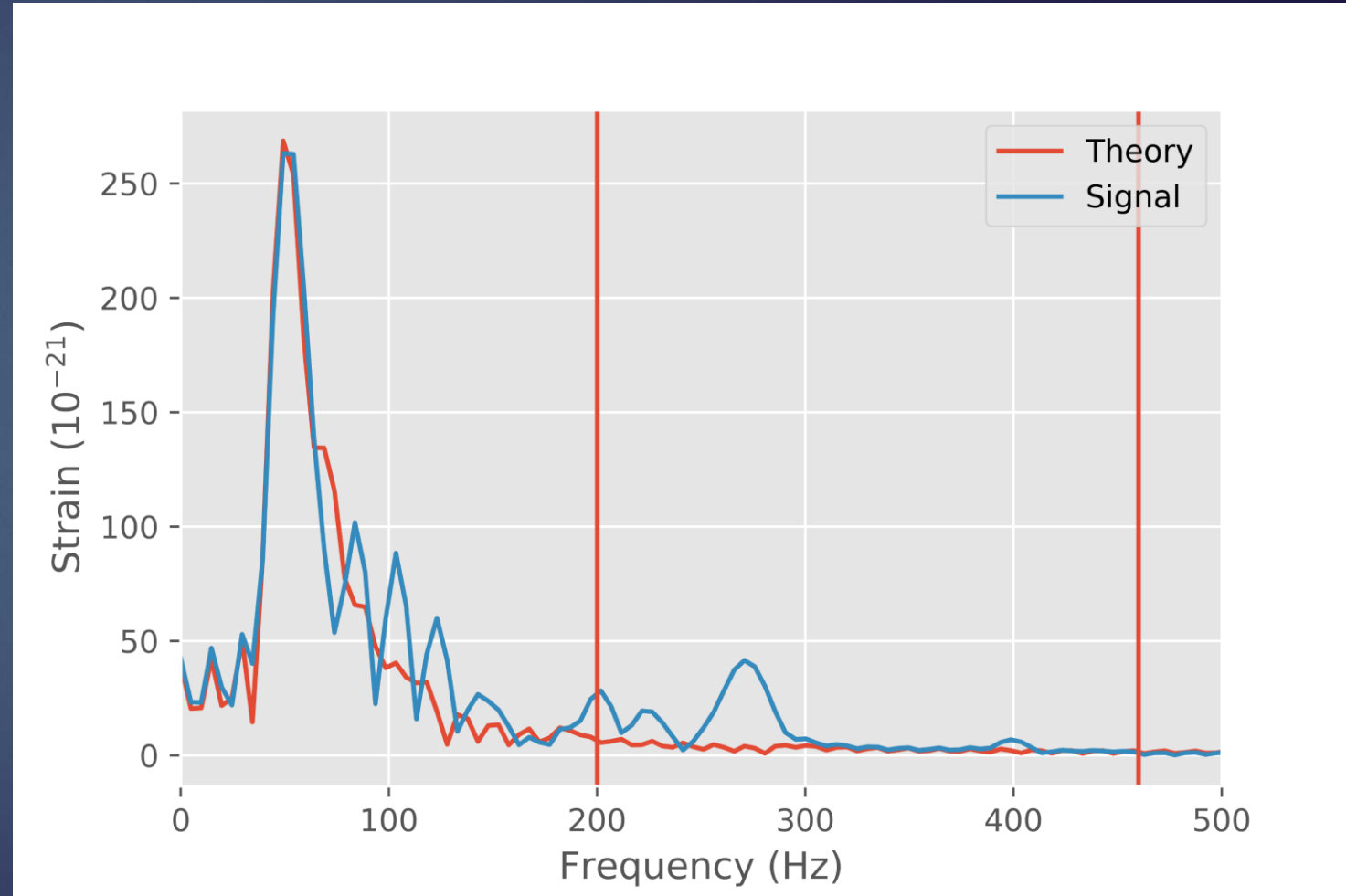
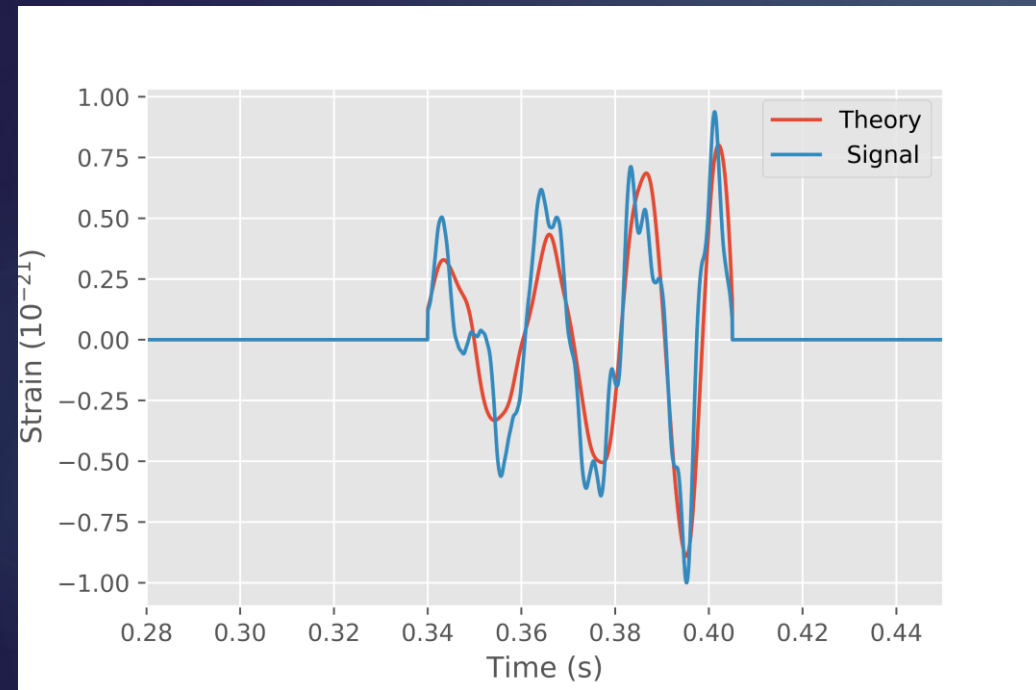
- ▶ Sometimes filtered data has bigger correlation than original data;
- ▶ Different behaviors for different windows;
- ▶ We could analyze the data in different windows...



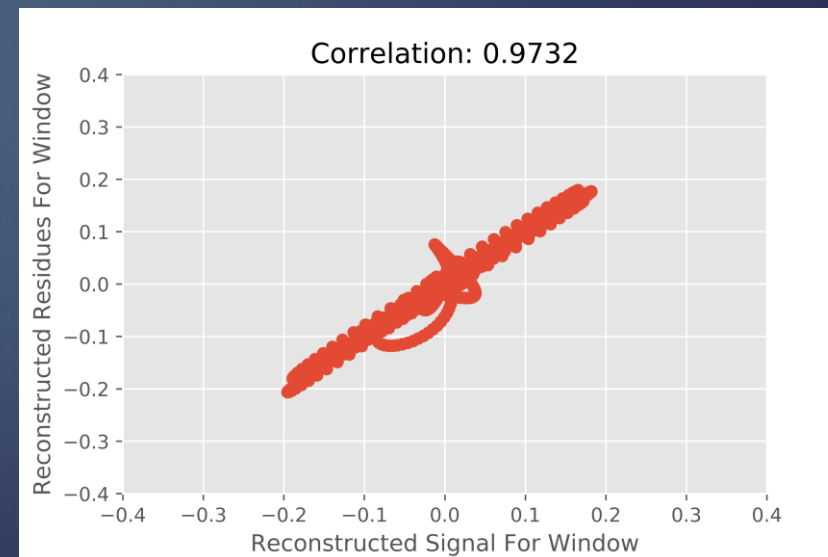
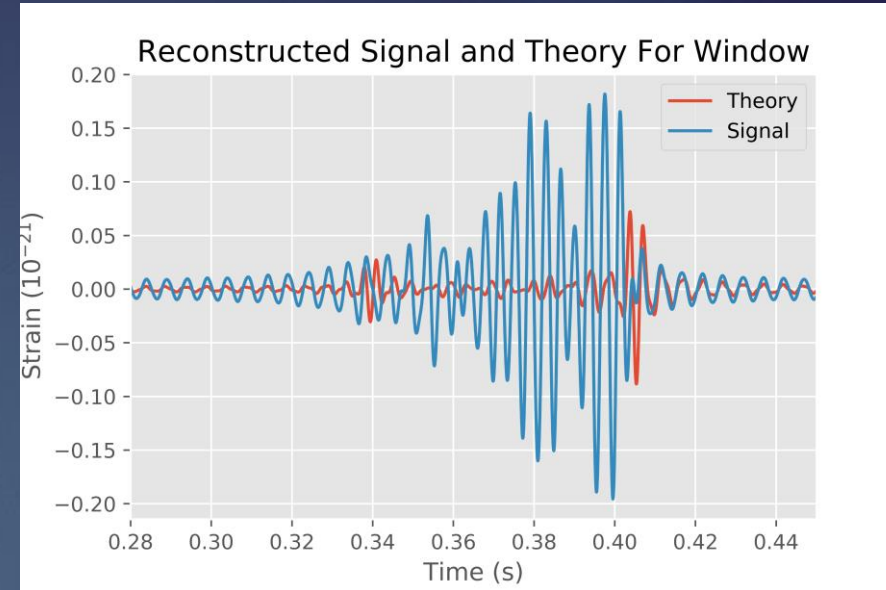
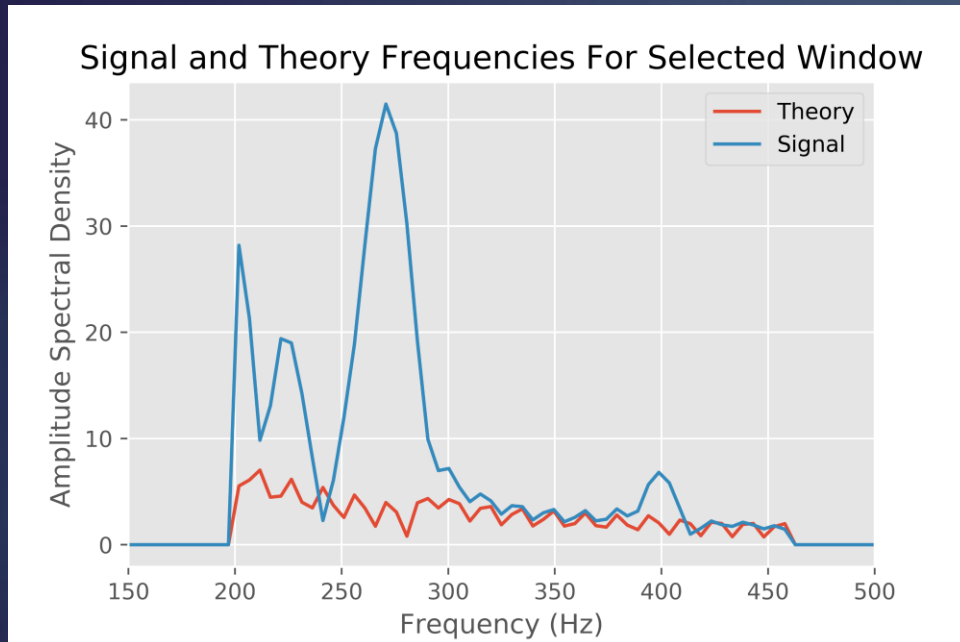


# Inspiral Fase Analysis

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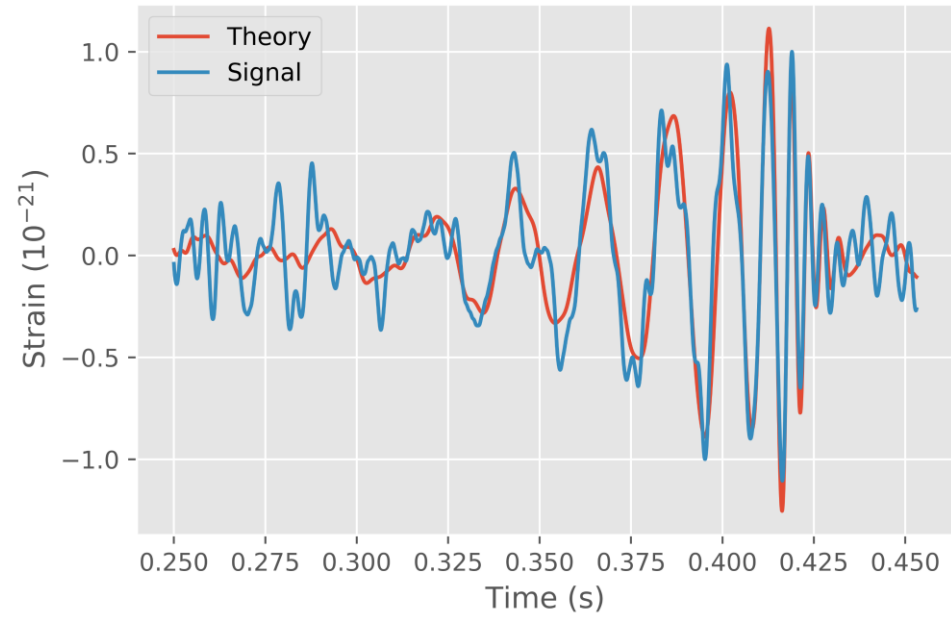


# More Noise?

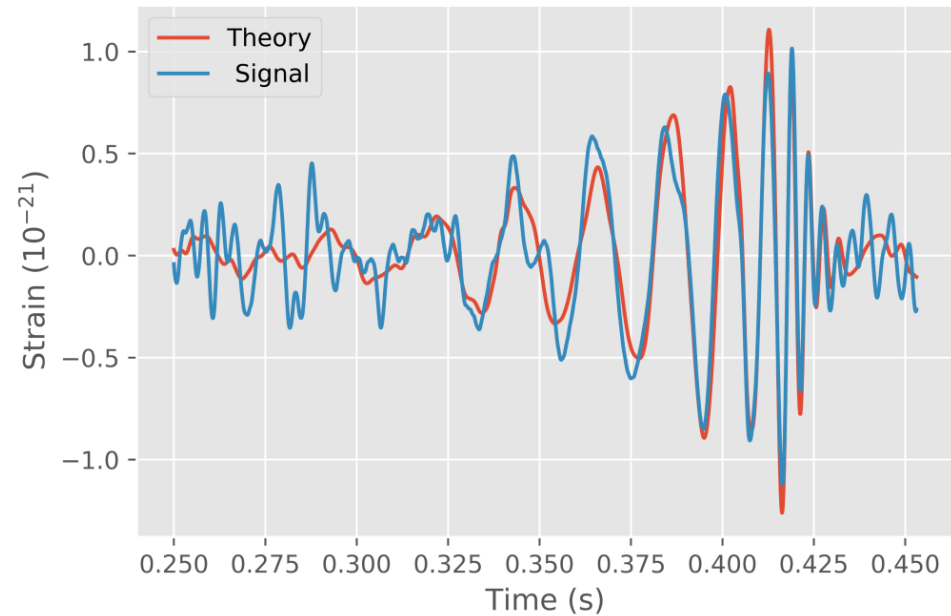


# Data Evolution

### Signal Without Noise in High Frequencies

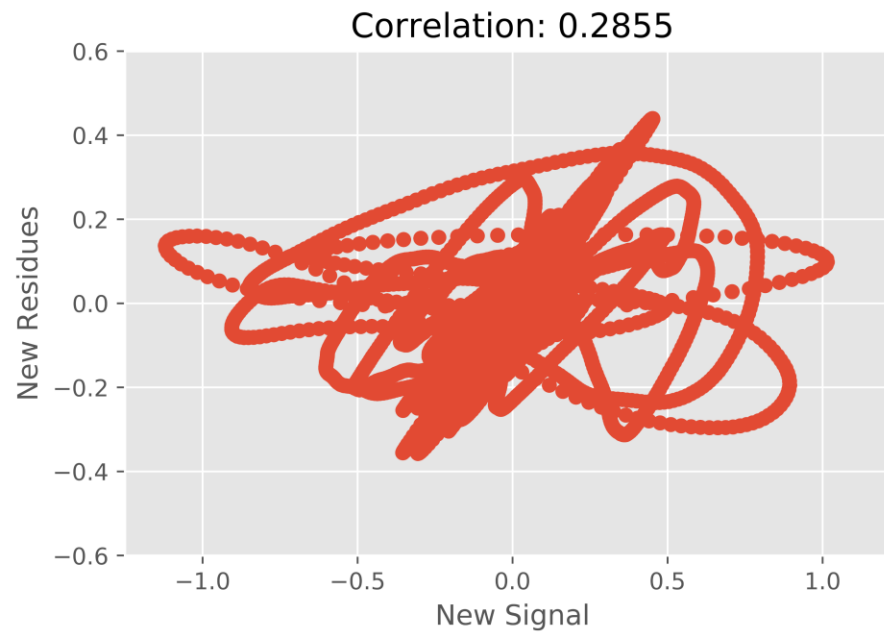
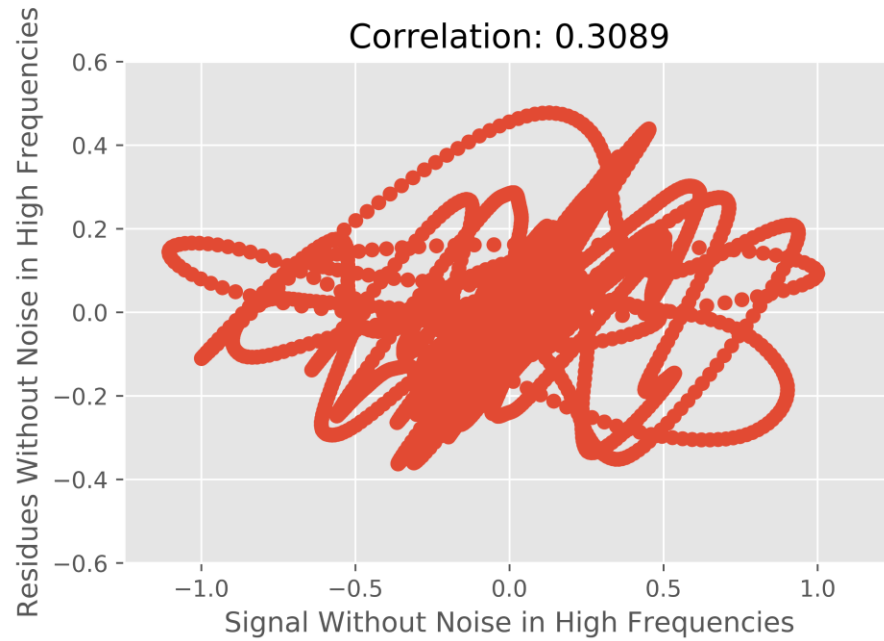


### Signal Without Selected Frequencies

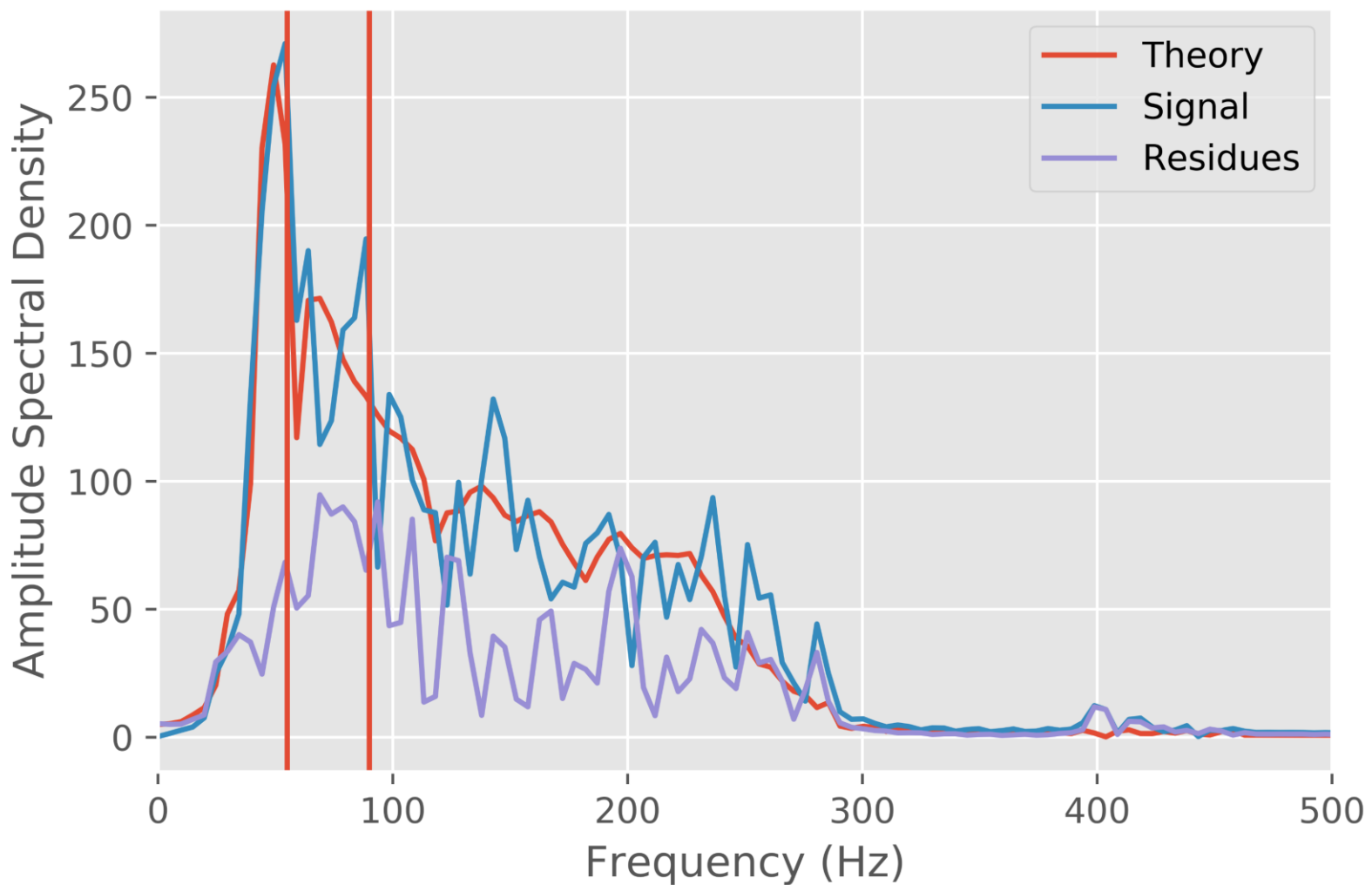


# Correlation Evolution

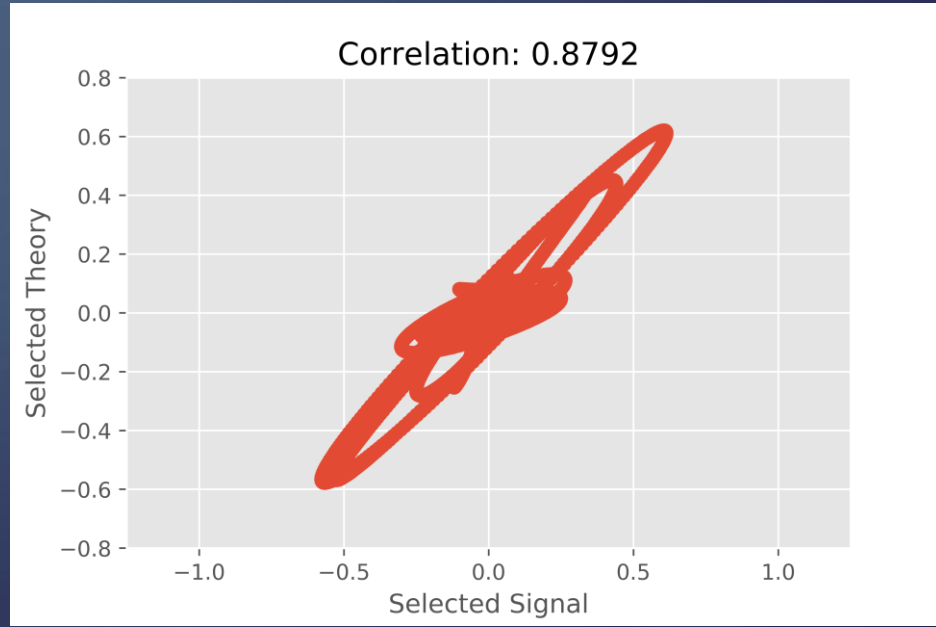
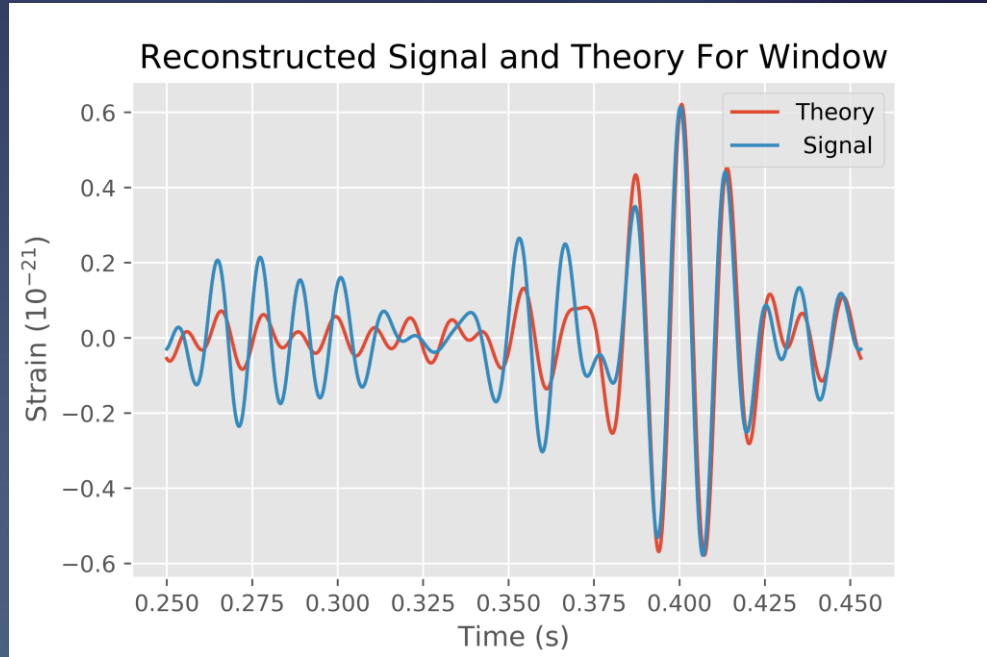
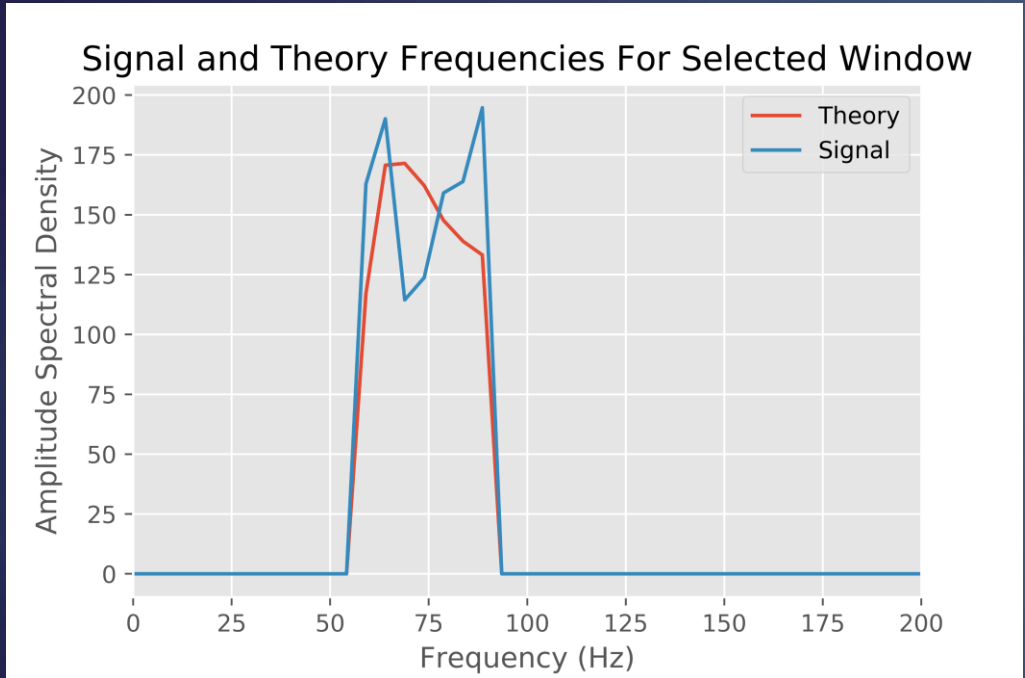
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# A New look at the Frequency Domain

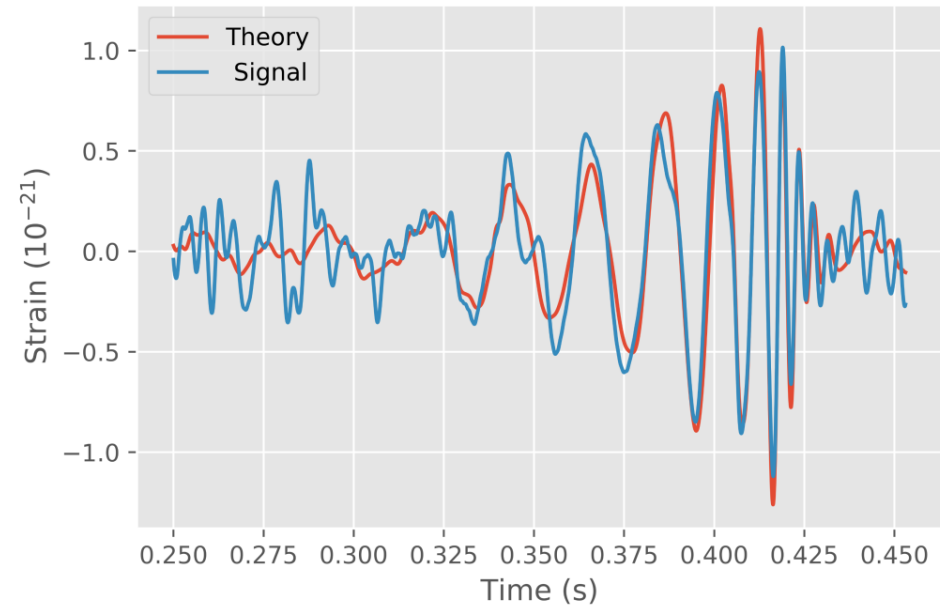


# High Residues

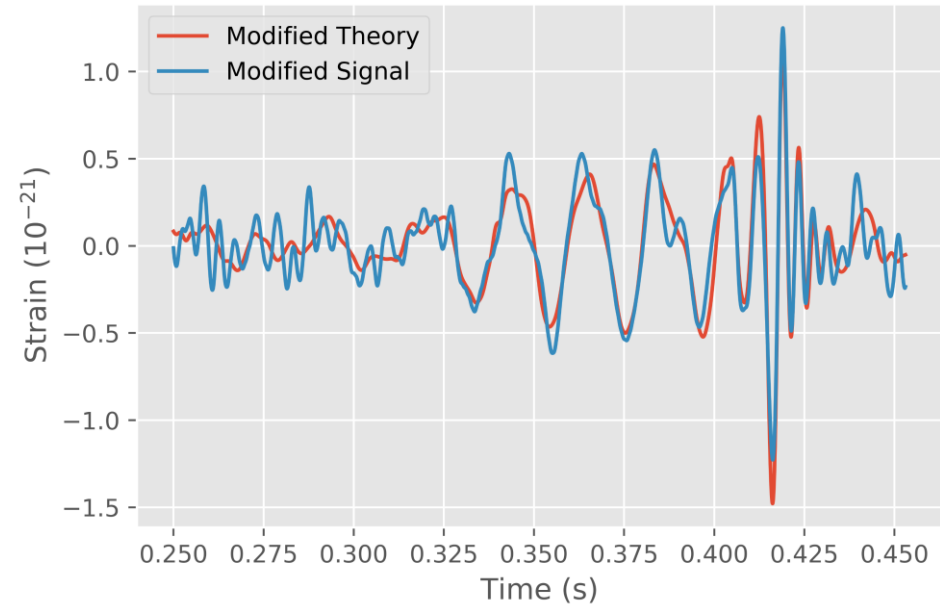


# Data Evolution

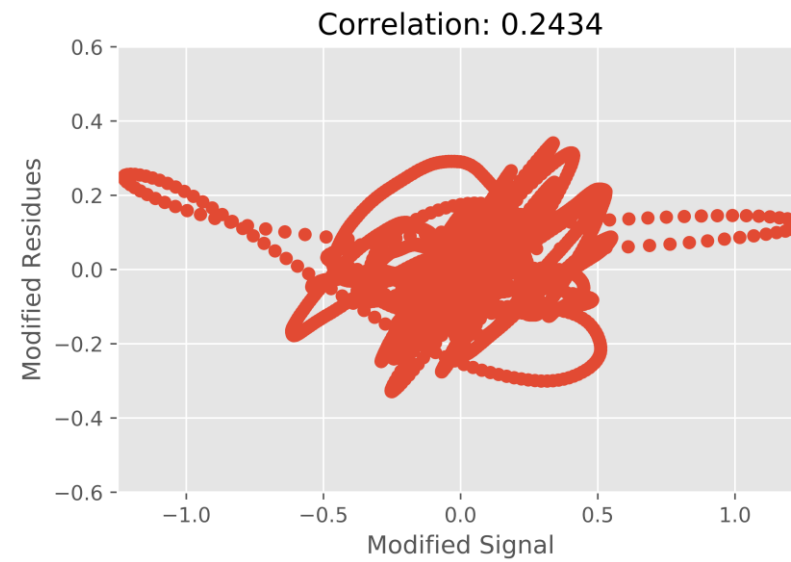
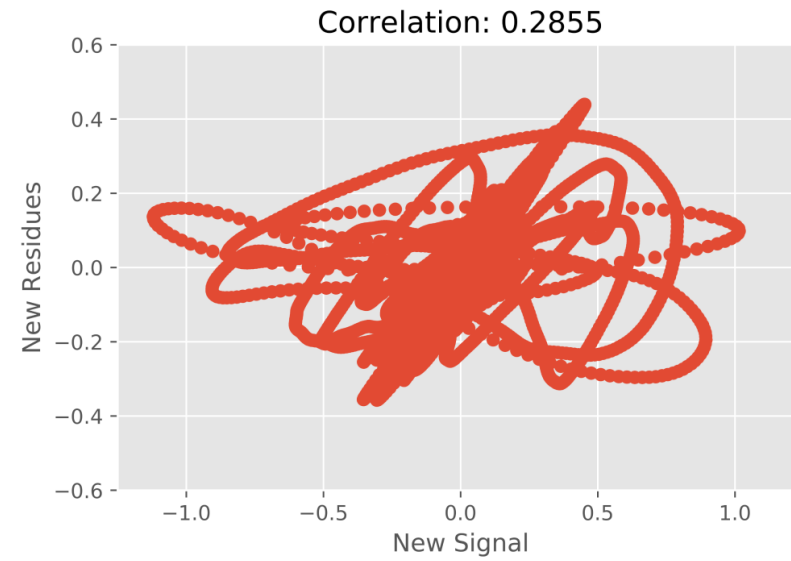
### Signal Without Selected Frequencies



### Modified Signal and Theory



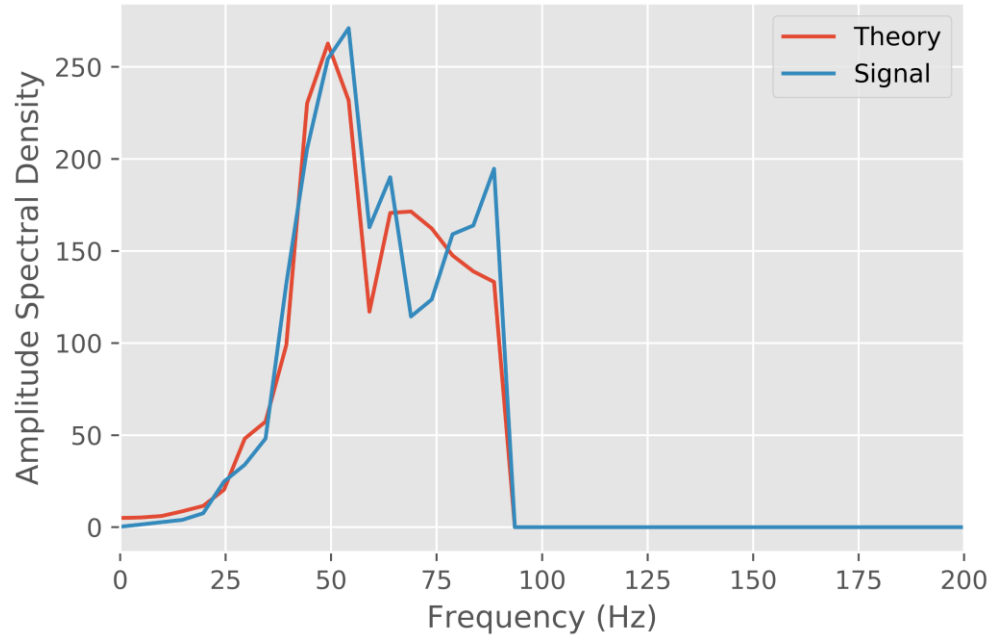
# Correlation Evolution



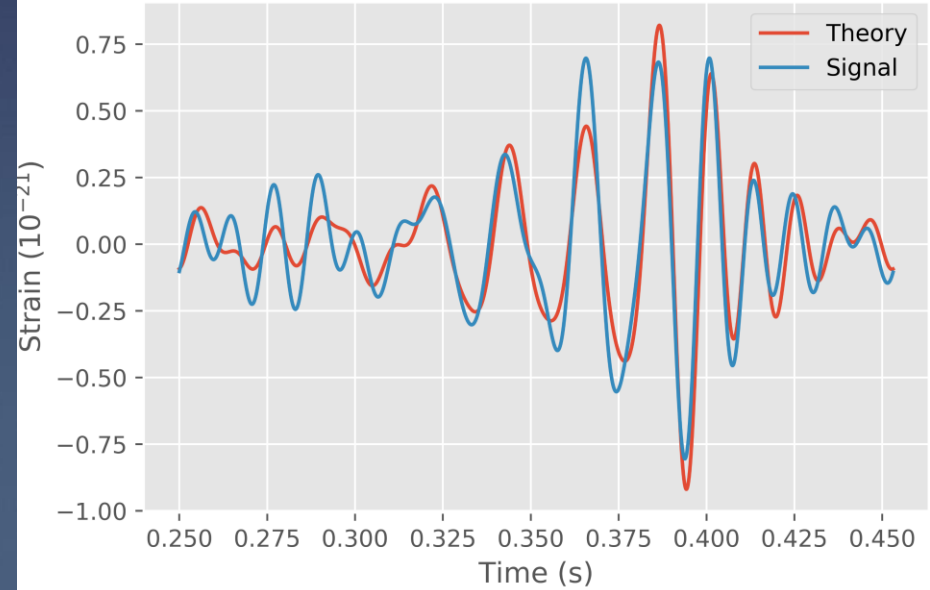


# Lower Frequencies

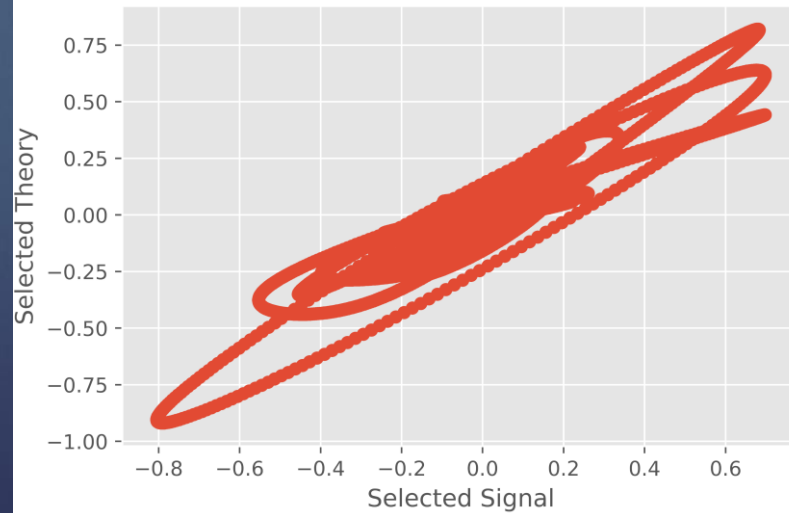
Signal and Theory Frequencies For Selected Window



Reconstructed Signal and Theory For Window

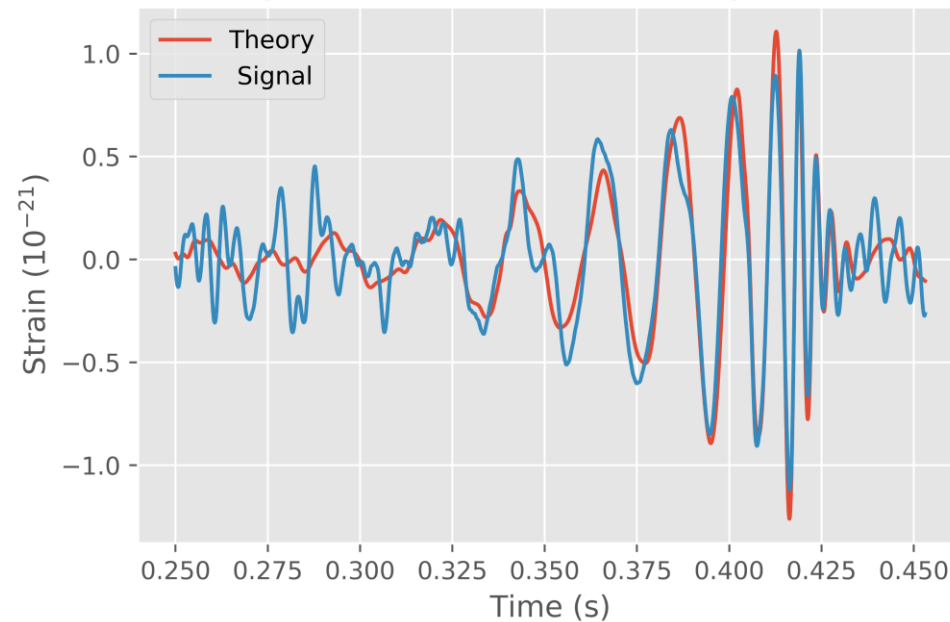


Correlation: 0.9264

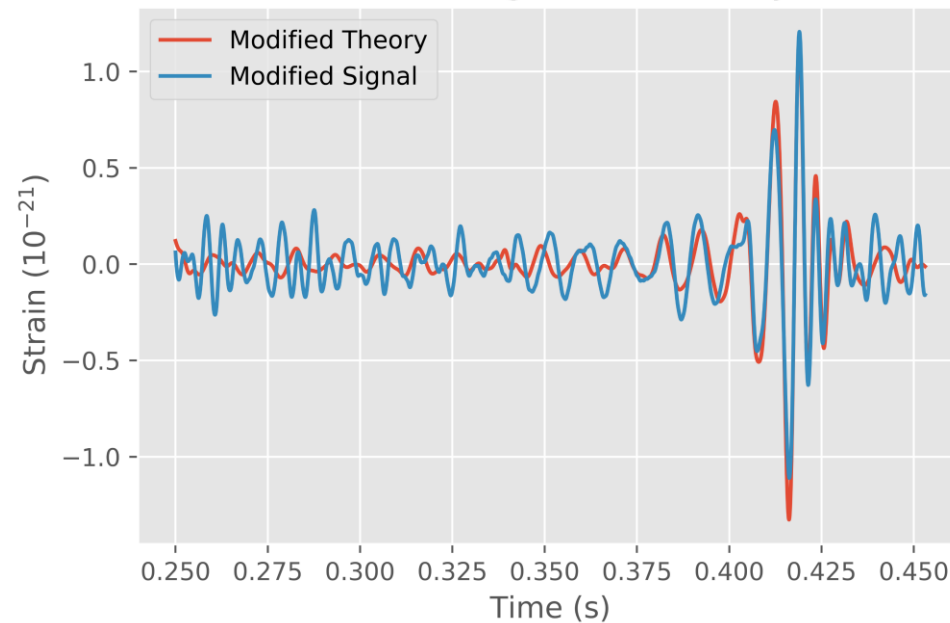


# Data Evolution

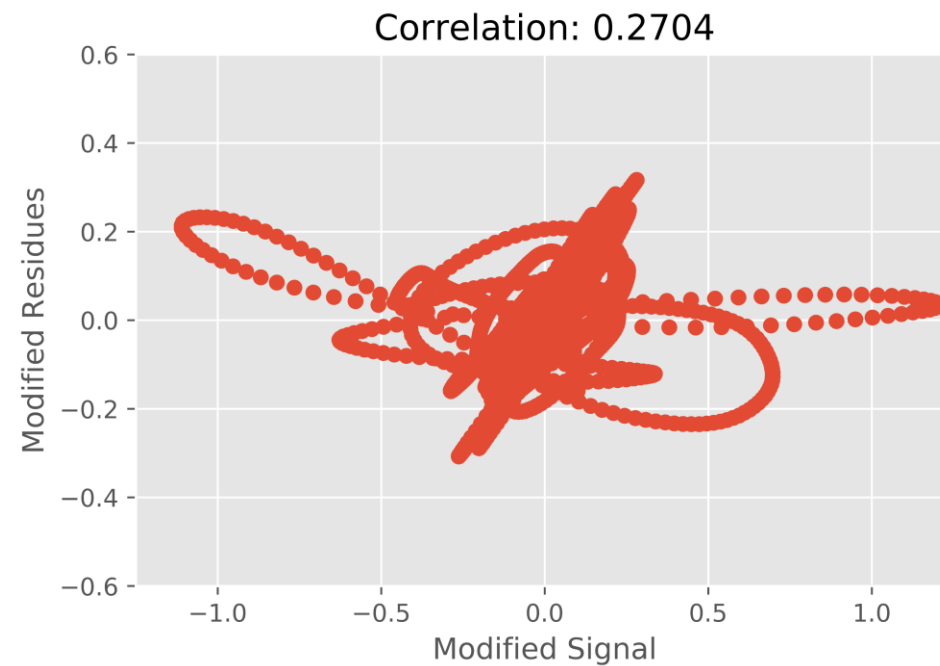
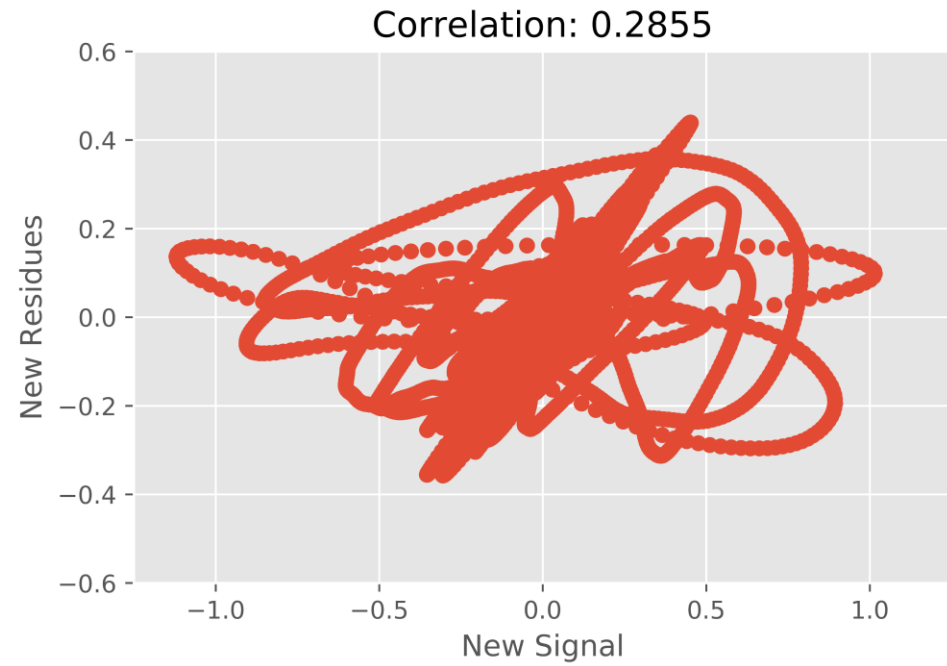
### Signal Without Selected Frequencies



### Modified Signal and Theory



# Correlation Evolution



# Conclusions

- ▶ We were able to find a window of noise in the high frequency region.
- ▶ In low frequencies, we didn't consider any noise because what we isolated was weak and by using that filter the correlation between residue and signal increased.
- ▶ Looking at the correlation plots we see that, by clearing the noise, not all zones got better correlations, some even got a little worse.
- ▶ This can happen because this noise has some modulation and does not behave the same way along the signal.
- ▶ By looking at different regions of the signal, we can find new noise or regions where our model seems to not describe the signal very well.