



Frequency Division Multiplexing

(a fundamental application
of digital signal processing)

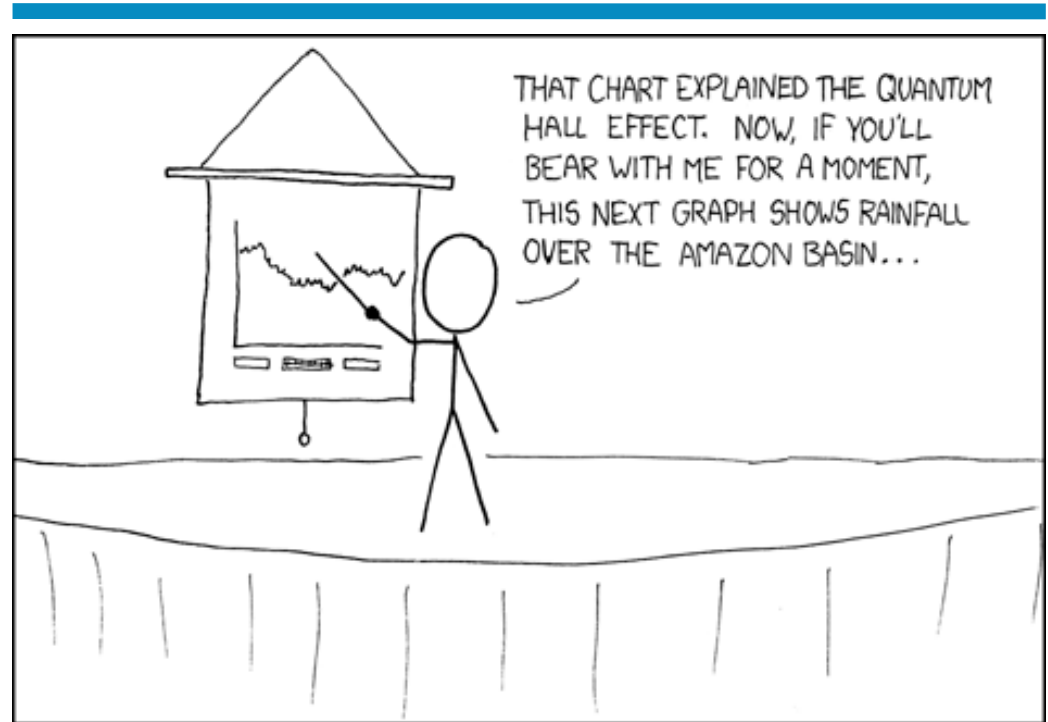
A Project for
APPM 4350: *Fourier Series
and Boundary Value Problems*



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+ Plan.

- Develop the mathematics behind digital signal processing
- Demonstrate Frequency Division Multiplexing
- Discuss real-world applications



IF YOU KEEP SAYING "BEAR WITH ME FOR A MOMENT", PEOPLE TAKE A WHILE TO FIGURE OUT THAT YOU'RE JUST SHOWING THEM RANDOM SLIDES.

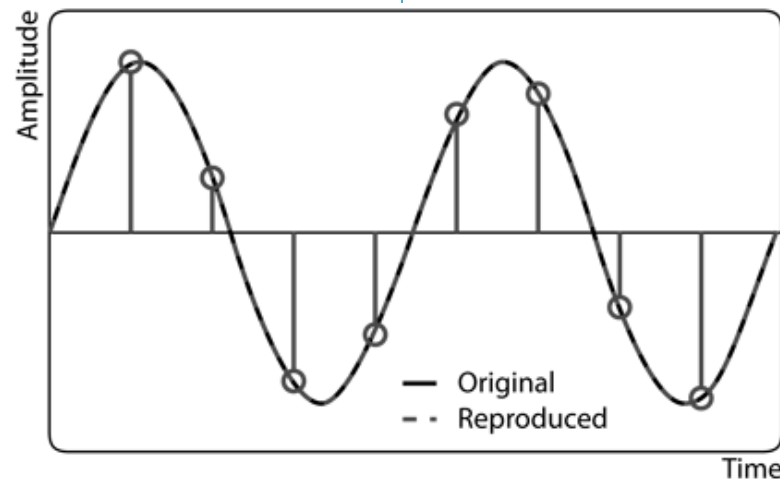
Image source: www.xkcd.com/365

+ Nyquist-Shannon Sampling Theorem

Any bandwidth limited function with the cutoff frequency Ω can be reconstructed exactly from samples taken at sampling frequency $f_s > 2 \Omega$.

- A function is bandwidth limited if:

$$\mathcal{F}(f(t)) = \hat{f}(\omega) \equiv 0 \quad \forall |\omega| > \Omega$$

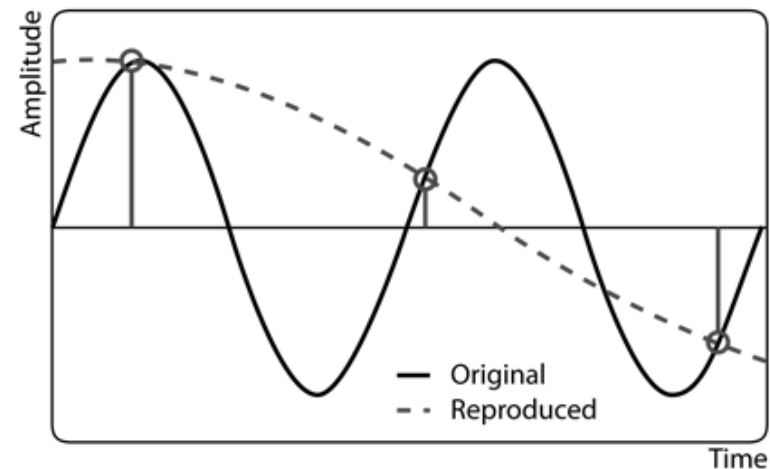


+ Importance

The Nyquist Sampling Theorem demonstrates how to use discrete samples to model continuous functions with frequencies $< f_s/2$

- Most signals are nearly band limited—meaning that most of the important information is within a certain band.
- Ex: a human voice usually only ranges between 60 and 7000 Hz, so $f_s > 1400$ Hz would accurately sample a voice

Downsampling, sampling a signal below its cutoff frequency, results in aliasing



+ Discrete Fourier Transform

The DFT takes a set of discrete samples f_k of the time-domain function $f(t)$ and produces a set of discrete samples of the Fourier transform of $f(t)$.

For some band limited $f(t)$ with a period of T_0 equal to some integer multiple N of the inverse sampling frequency $1/f_s$:

$$\mathcal{F}(f(t)) = \int_{-\infty}^{\infty} f(t) e^{i\omega t} dt = \frac{1}{T_0} \int_0^{T_0} f(t) e^{i \frac{2\pi}{T_0} t} dt$$

The Riemann sum of the Fourier transform with N intervals is:

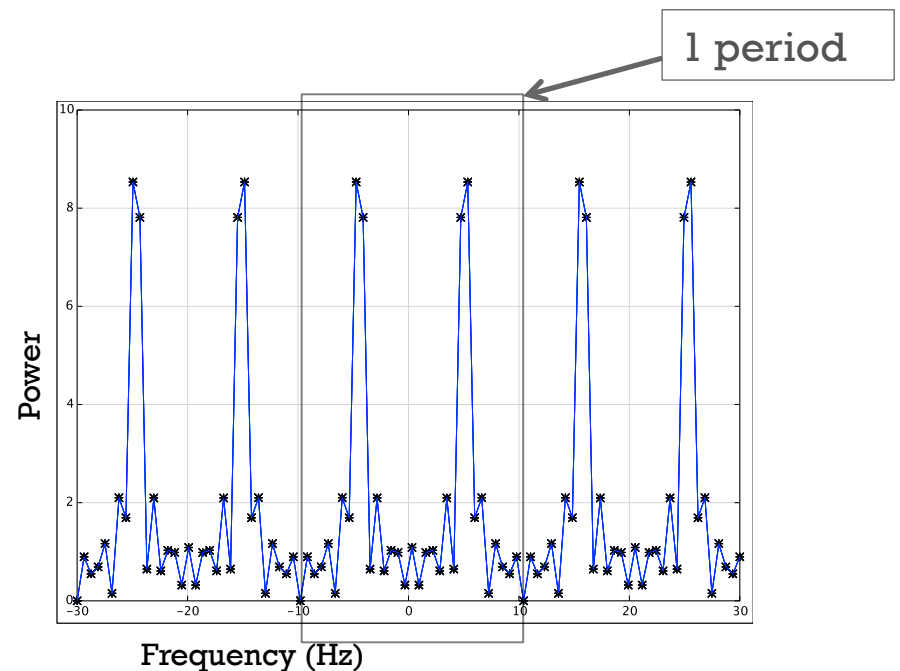
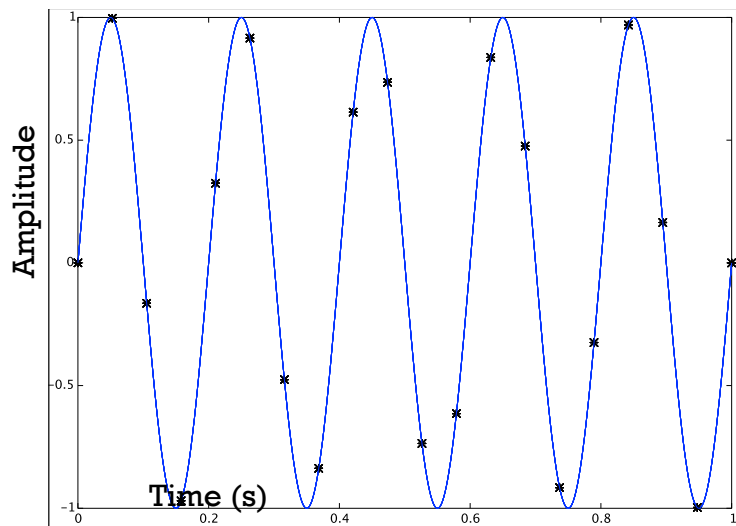
$$DFT(f(t)) = \frac{1}{N} \sum_{k=0}^{N-1} f_k e^{i \frac{2\pi n}{N} k}$$

+ Periodicity of the DFT

In formulating the DFT, we assumed the function to be periodic on T_0 , with $T_0 = N/f_s$.

\Rightarrow Then the DFT is also periodic on N samples.

$\Rightarrow f_s = 20\text{Hz}$, so the period of the DFT is 20Hz



+ Reality Condition

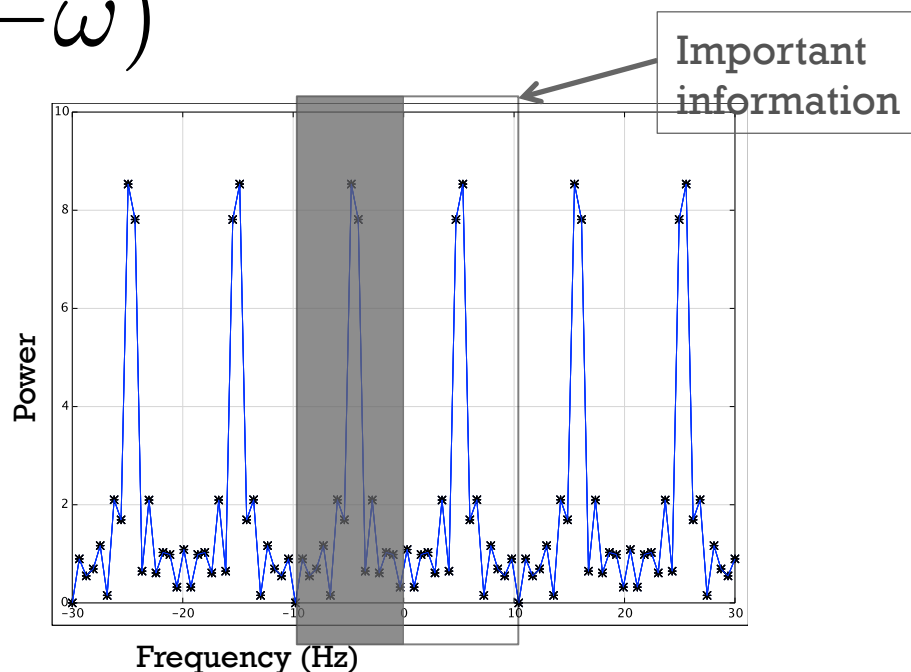
For all Fourier transforms of all real-valued functions:

$$\hat{f}(\omega) = \overline{\hat{f}(-\omega)}$$

For an even, real valued function:

$$\hat{f}(\omega) = \hat{f}(-\omega)$$

⇒ *Redundant information can be recognized and thrown out*

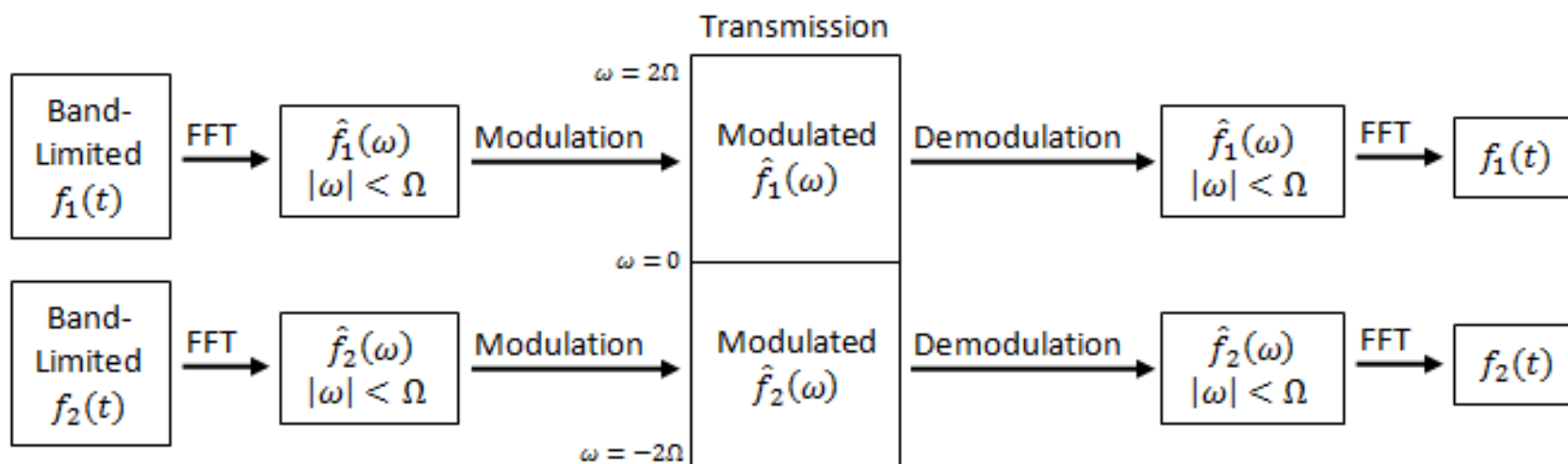


+ Fast Fourier Transform

A Fast Fourier Transform (FFT) is an efficient implementation of the discrete Fourier transform and its inverse.

- Computing the DFT the naïve way requires $O(n^2)$ operations. FFTs reduce the time complexity to $O(n \log(n))$
- Most commonly used FFT is the Cooley-Tukey algorithm, which is a type of divide-and-conquer algorithm
 - Relies on the symmetry properties of the DFT to break the transform into smaller problems over smaller intervals
 - Base-2 case: an N element DFT is split into two $N/2$ element DFTs, of the even-indexed and the odd-indexed terms

+ Frequency Division Multiplexing (finally)

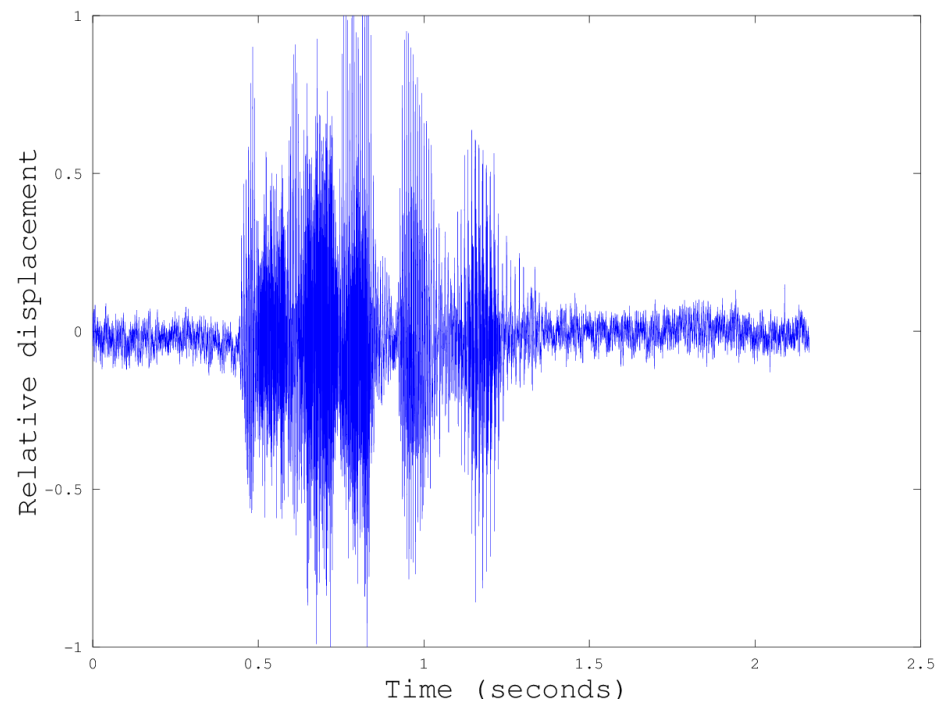
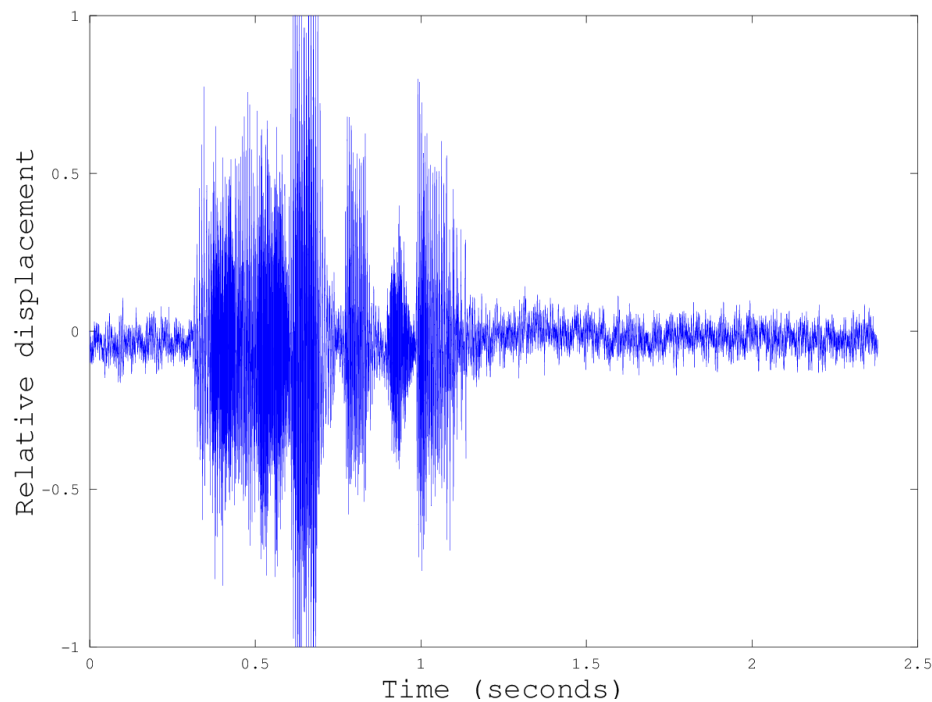


+ Our Implementation & Demonstration

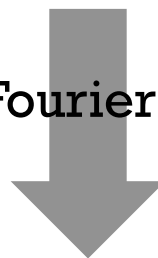
- 2 voice samples
 - Cutoff frequency of a human voice $\sim 7000\text{Hz}$
- Sampling at $f_s > 2(7000\text{Hz})$
 - $f_s = 8000\text{Hz}$
- Bandwidth of “transmitted” signal = 16000Hz
- GNU Octave implementation (an open-source MATLAB© alternative)



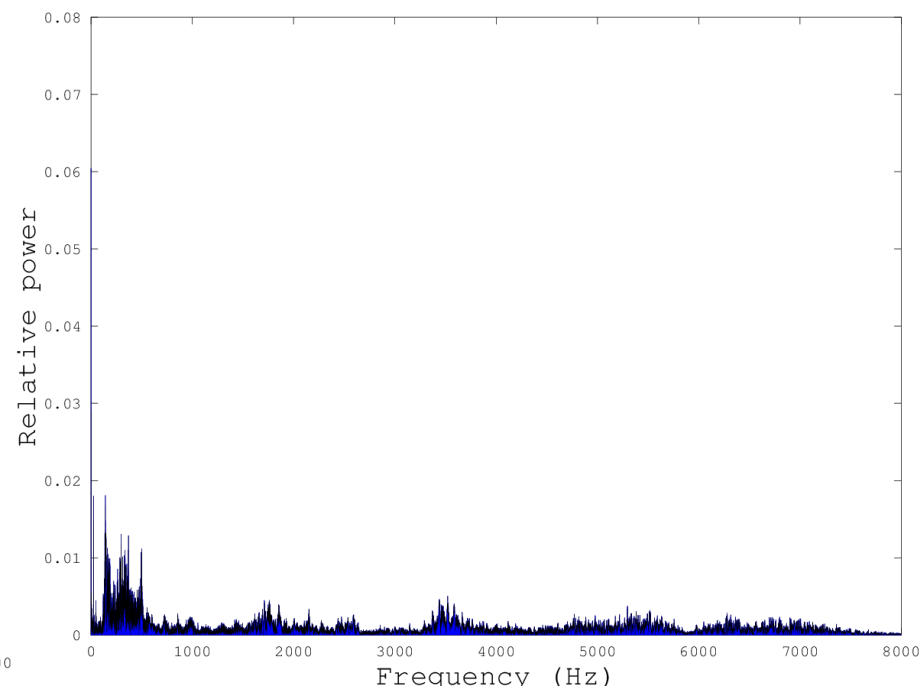
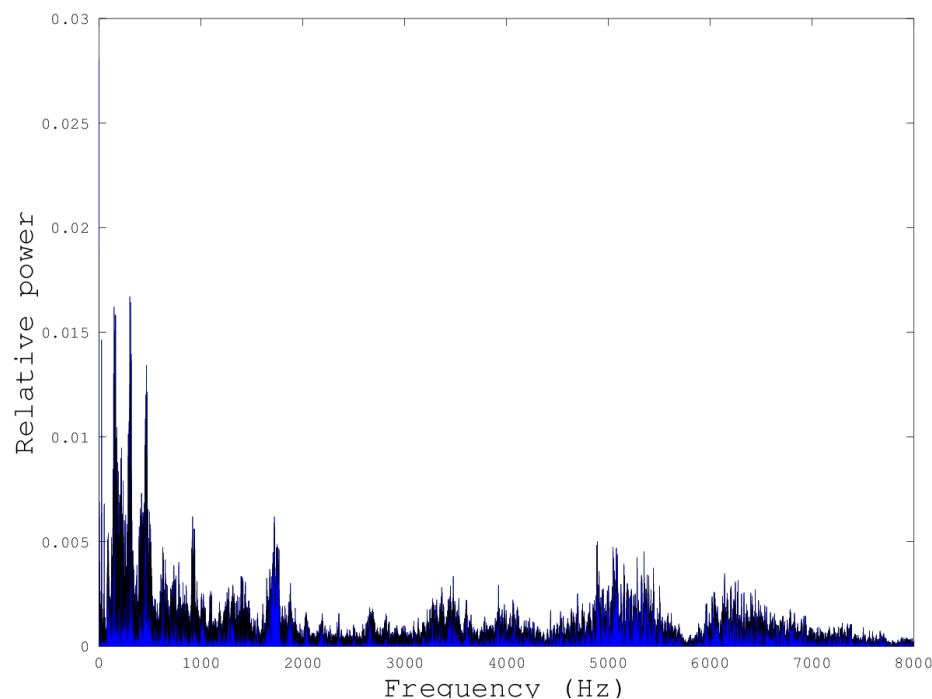
+ The original two sound files



Take the Fourier Transform

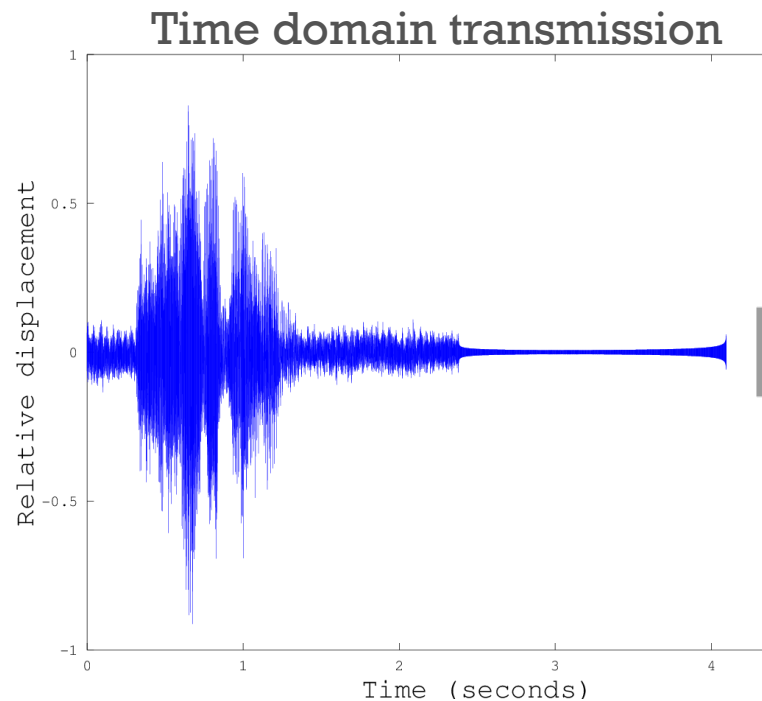


+ The data in the frequency domain

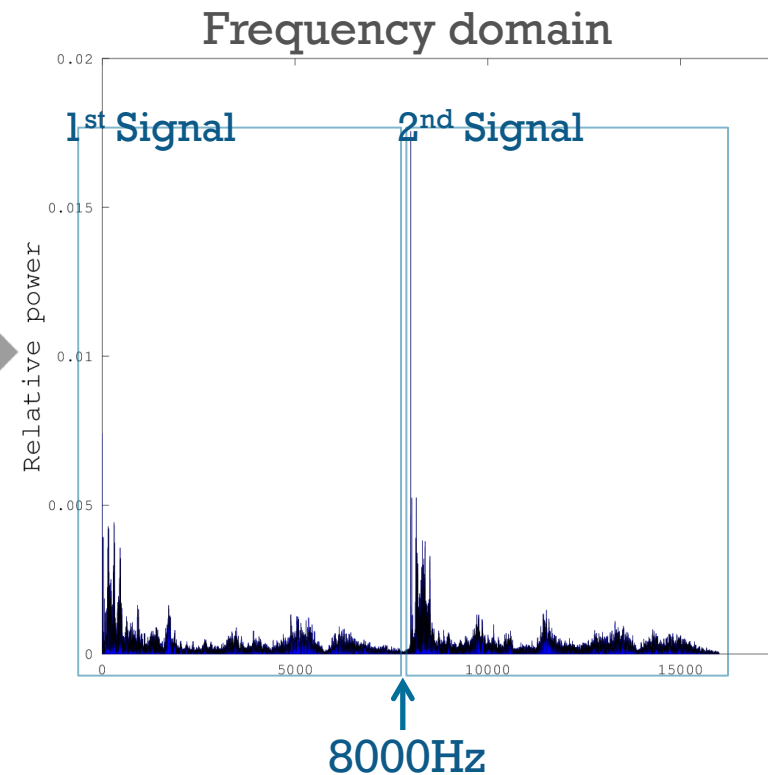


**Modulate, concatenate and take the
inverse transform of the signals**

- + One time-domain signal with twice the bandwidth, ready for transmission

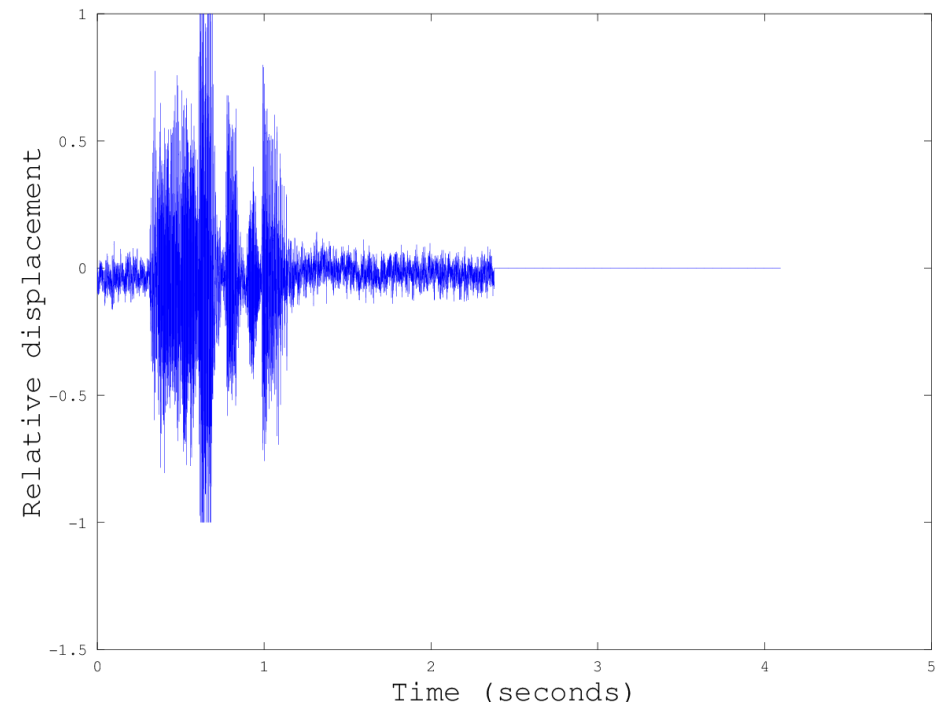
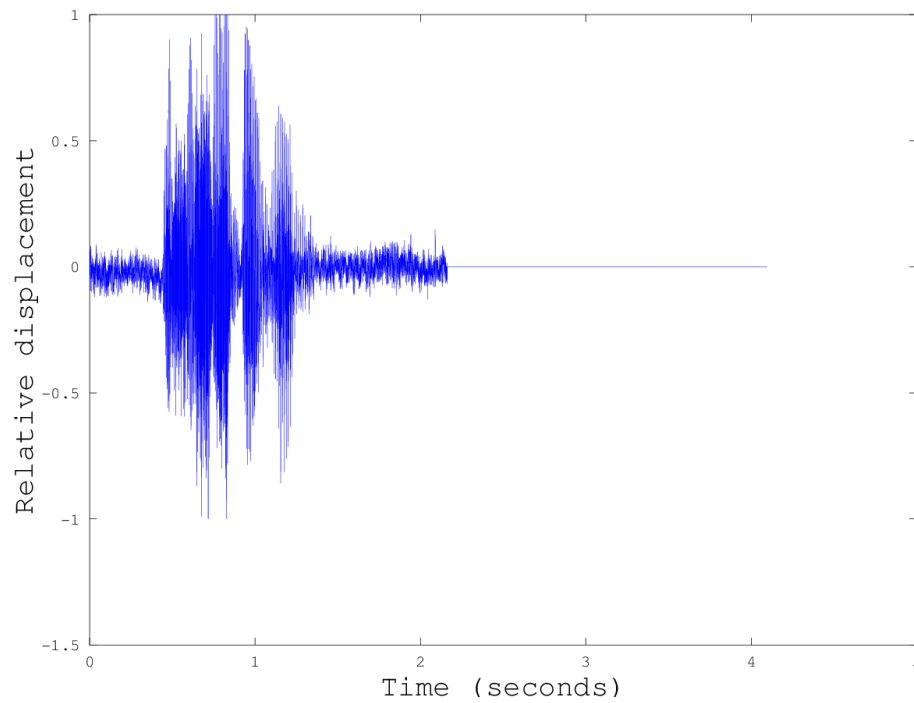


Fourier
Transform



Demodulate & Separate
the Signals

+ The received signals



Ta-da!

+ A Broader Perspective

- Telephone system
 - Use digital FDM to send multiple signals over the same analogue phone line
- Radio
 - Use analogue FDM to transmit multiple channels over the air at once
 - Each station uses its own frequency bandwidth & your radio demodulates on the receiving end
- Real FDM uses buffer frequency bands to prevent analogue noise from the electronics /air /phone line etc from causing the signals to mix

+ Extension of Principles

- Human audio-visual perception is bandwidth limited, which allows for various forms of data compression filtering out less perceptible data.
- Recent experimentation with signal transmission (including using different wavelength lasers to send multiple signals over one fiber optic cable) makes use of FDM principles.
- Converting sounds and images into the frequency domain helps researchers to identify materials, chemicals, distinct voices, and detect edges.
- Synthesizers and auto-tuners analyse audio signals in the frequency domain and then frequency-shift those signals.
- Image manipulation software selects for and changes only certain frequencies in an image.