

Lecture 7b: Fourier Synthesis

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ECE 401: Signal and Image Analysis

1 Periodic Signals

2 Pitch

3 Summary

Outline

1 Periodic Signals

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Fourier's theorem

Why have we been focused on sampling sinusoids? Because **any** periodic signal can be written as a sum of sinusoids. Fourier's theorem says that any $x(t)$ that is periodic, i.e.,

$$x(t + T_0) = x(t)$$

can be written as

$$x(t) = \sum_{k=-\infty}^{\infty} X_k e^{j2\pi k F_0 t}$$

Analysis and Synthesis

- **Fourier Analysis** is the process of finding the spectrum, X_k , given the signal $x(t)$. I'll tell you how to do that next lecture.
- **Fourier Synthesis** is the process of generating the signal, $x(t)$, given its spectrum. I'll spend the rest of today's lecture showing examples and properties of synthesis.

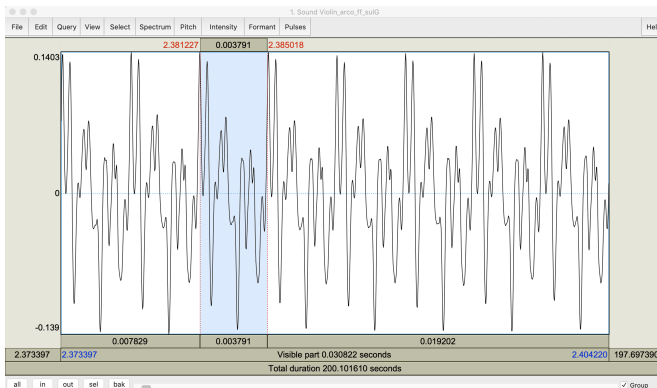
Example #2: Sawtooth wave

By Lucas Vieira, public domain 2009, https://commons.wikimedia.org/wiki/File:Periodic_identity_function.gif

Example: A weird arbitrary signal

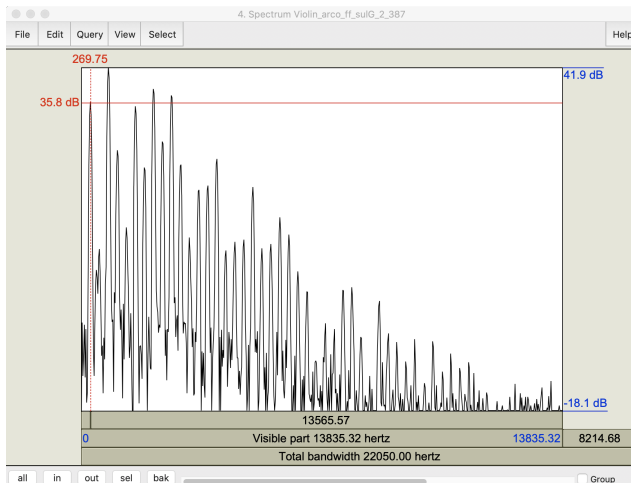
By Scallop7, CC-SA 4.0 2007, https://commons.wikimedia.org/wiki/File:Example_of_Fourier_Convergence.gif

Example: Violin



Eight periods from the recording of a violin playing
 $f = 1/0.003791 = 262\text{Hz}$, i.e., C4 (middle C). Waveform
distributed by **University of Iowa Electronic Music Studios**.

Example: Violin



Log magnitude spectrum ($20 \log_{10} |X_k|$) for the first 43 harmonics or so ($1 \leq k \leq 43$ or so) of a violin playing C4. Waveform distributed by [University of Iowa Electronic Music Studios](#).

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The missing fundamental

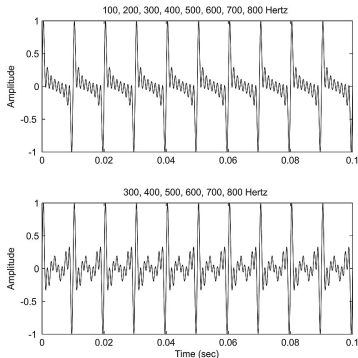
Suppose we have a signal of the form

$$x(t) = \sum_{k=-\infty}^{\infty} X_k e^{j2\pi k F_0 t}$$

Humans will hear the frequency F_0 to be the pitch of this sound, even if $X_{-1} = X_1 = 0$, i.e., even if the sound has no energy at the frequency F_0 .

The missing fundamental

Our visual perception matches auditory perception. For example:



CC-SA 3.0, https://commons.wikimedia.org/wiki/File:Illustration_of_common_periodicity_of_full_spectrum_and_missing_fundamental_waveforms.jpg

Quiz

Try the quiz! Go to the course webpage, and click on today's date.

The autocorrelation theory of pitch perception

The mystery of the missing fundamental was solved by Licklider in 1951. He showed that we can explain why humans hear F_0 as the pitch if we assume that humans use the following strategy:

- 1 Divide the sound into separate harmonics
- 2 Set the phase of each harmonic to zero
- 3 Add them back together again

The result is a signal with a sharp peak, once per pitch period. Try it in a Jupyter notebook: replace `X[k]` by `np.abs(X[k])` to eliminate its phase.

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- **Fourier's Theorem:** Any periodic waveform, $x(t + T_0) = x(t)$, can be synthesized as

$$x(t) = \sum_{k=-\infty}^{\infty} X_k e^{j2\pi k F_0 t}$$

- **Autocorrelation theory of pitch perception:** If all of the Y_k are positive real numbers, then we can recover the pitch period by setting the phase of each harmonic to zero.