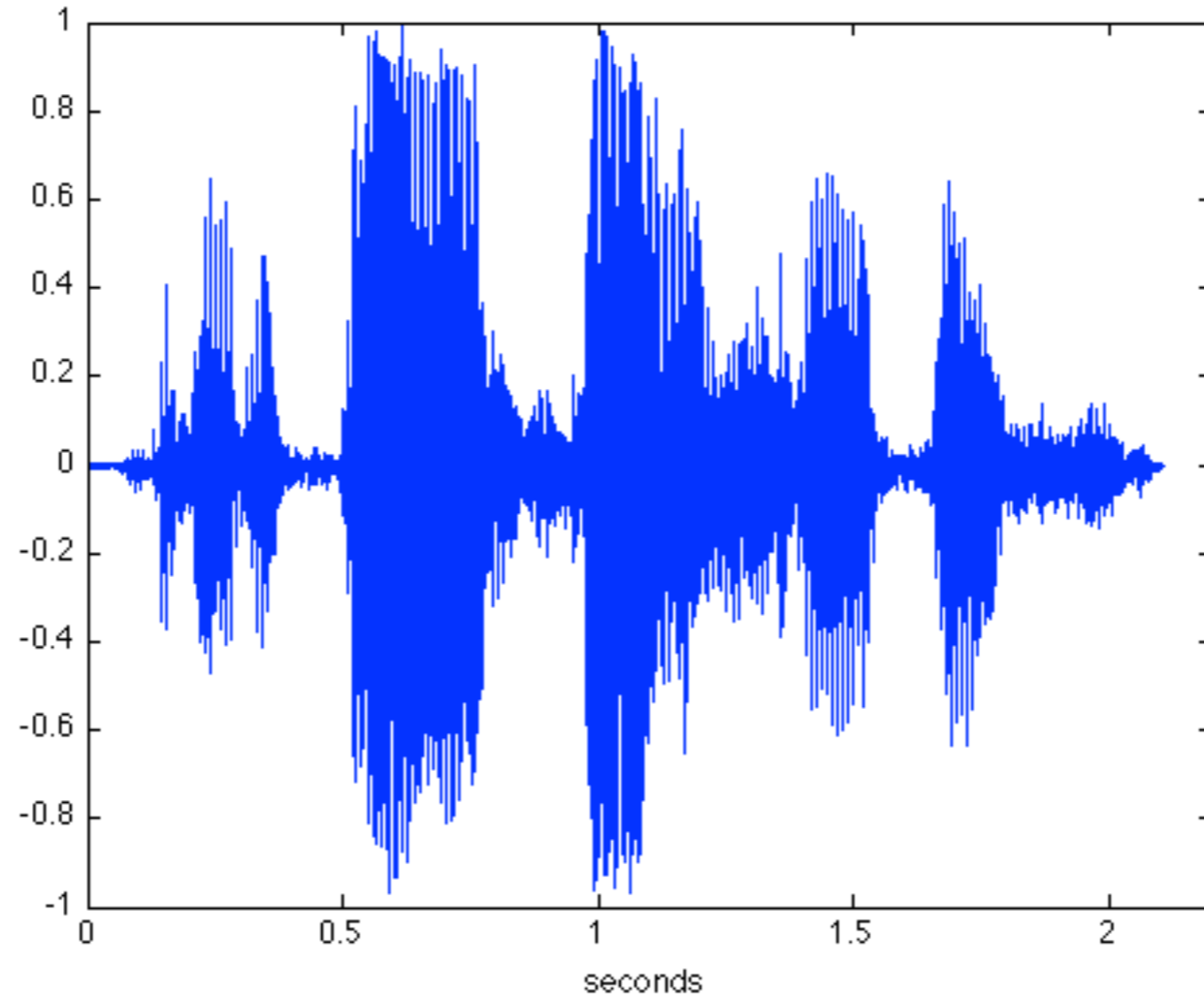
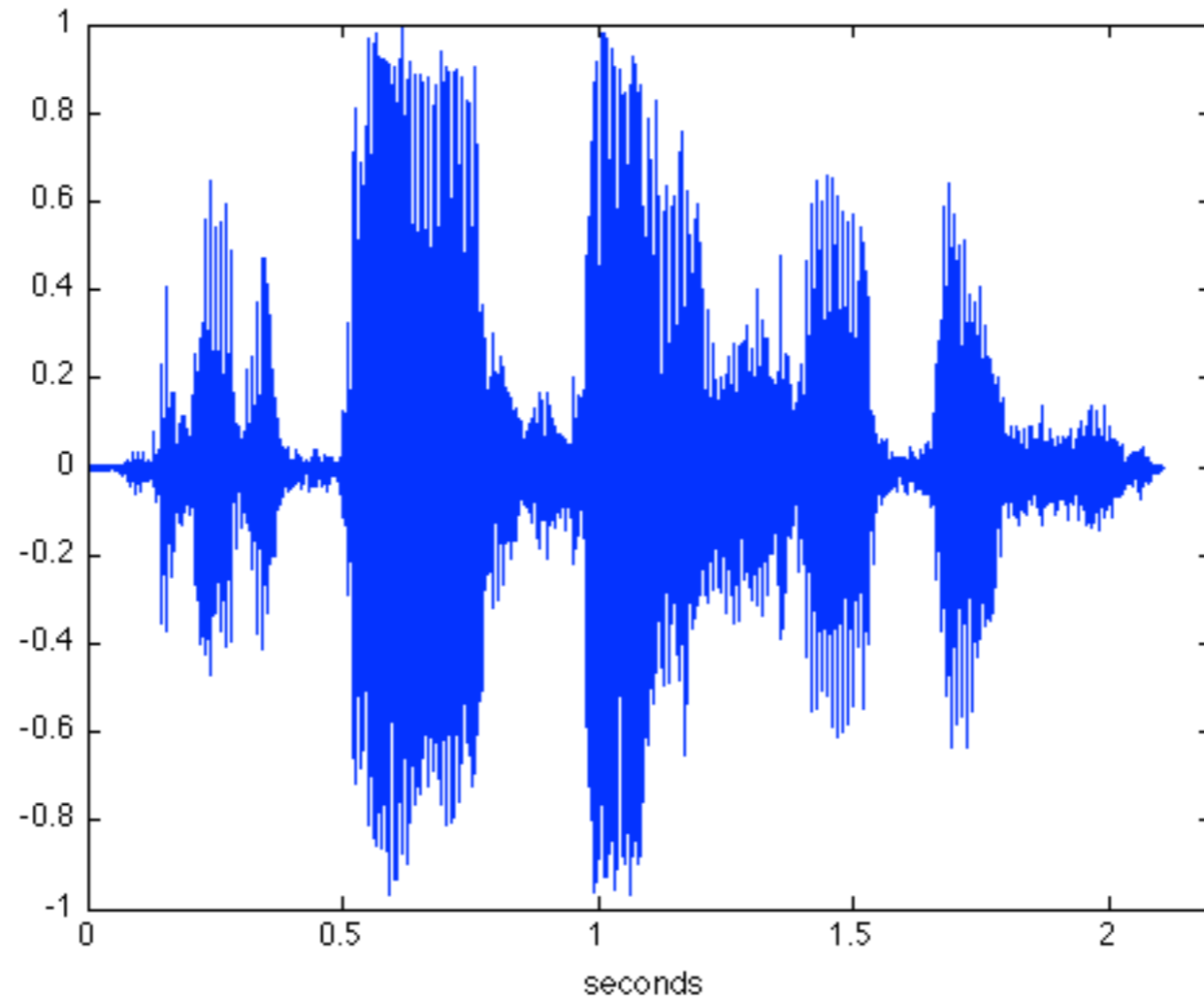


Sounds as waveforms



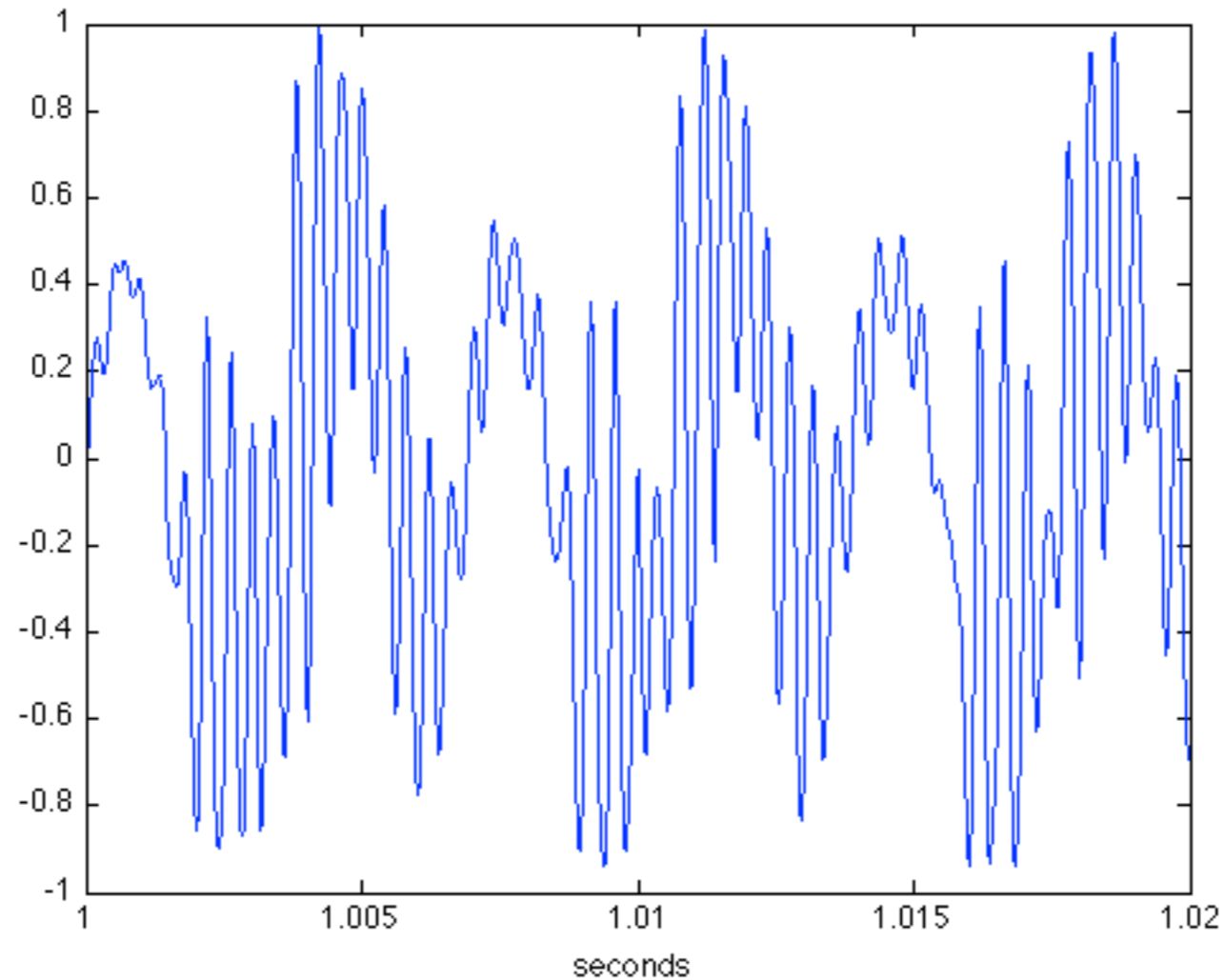
Where did this sound come from?

Sounds as waveforms



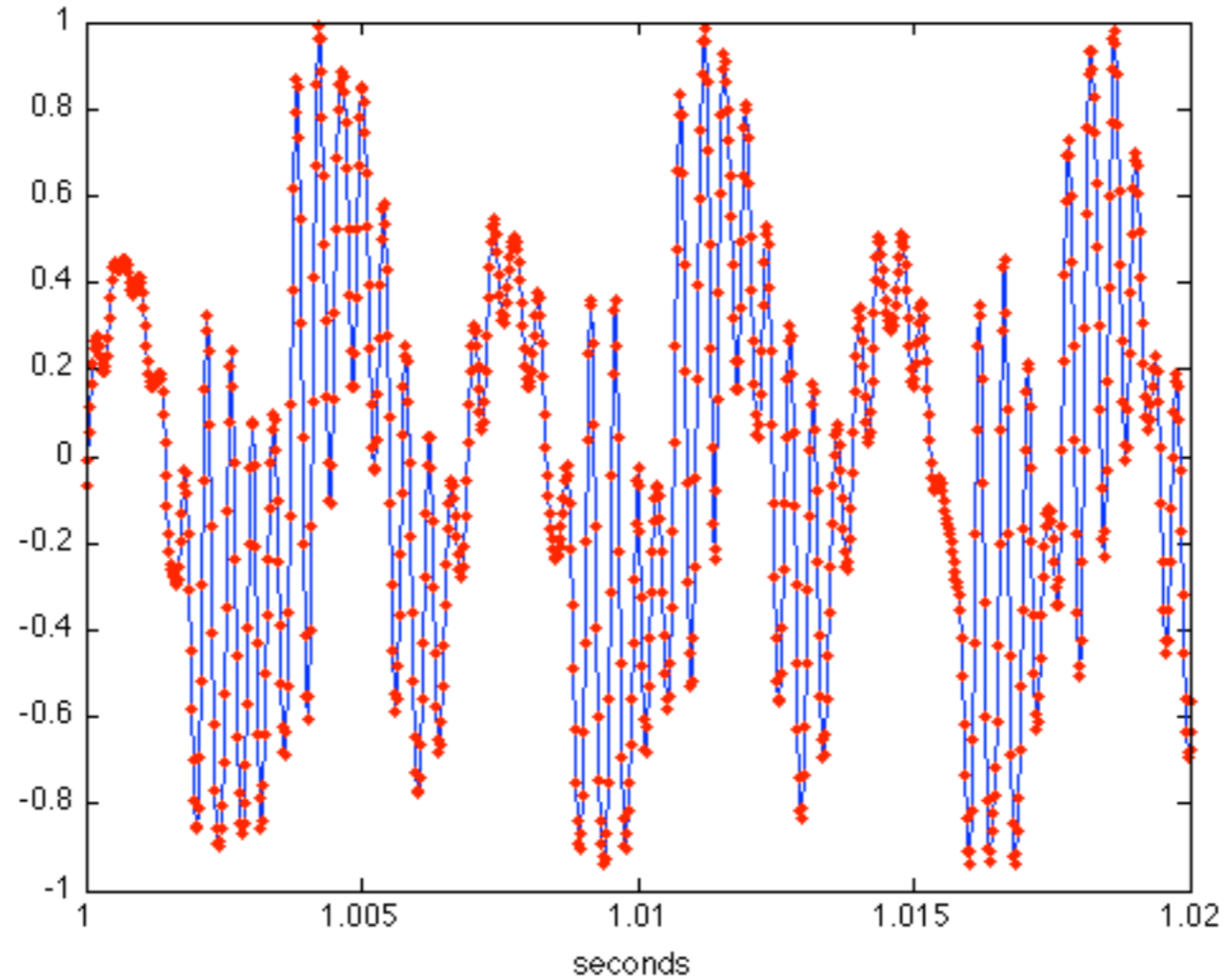
Where did this sound come from?

Sounds as waveforms



“I’ve got a bad feeling about this..”

Sounds as waveforms

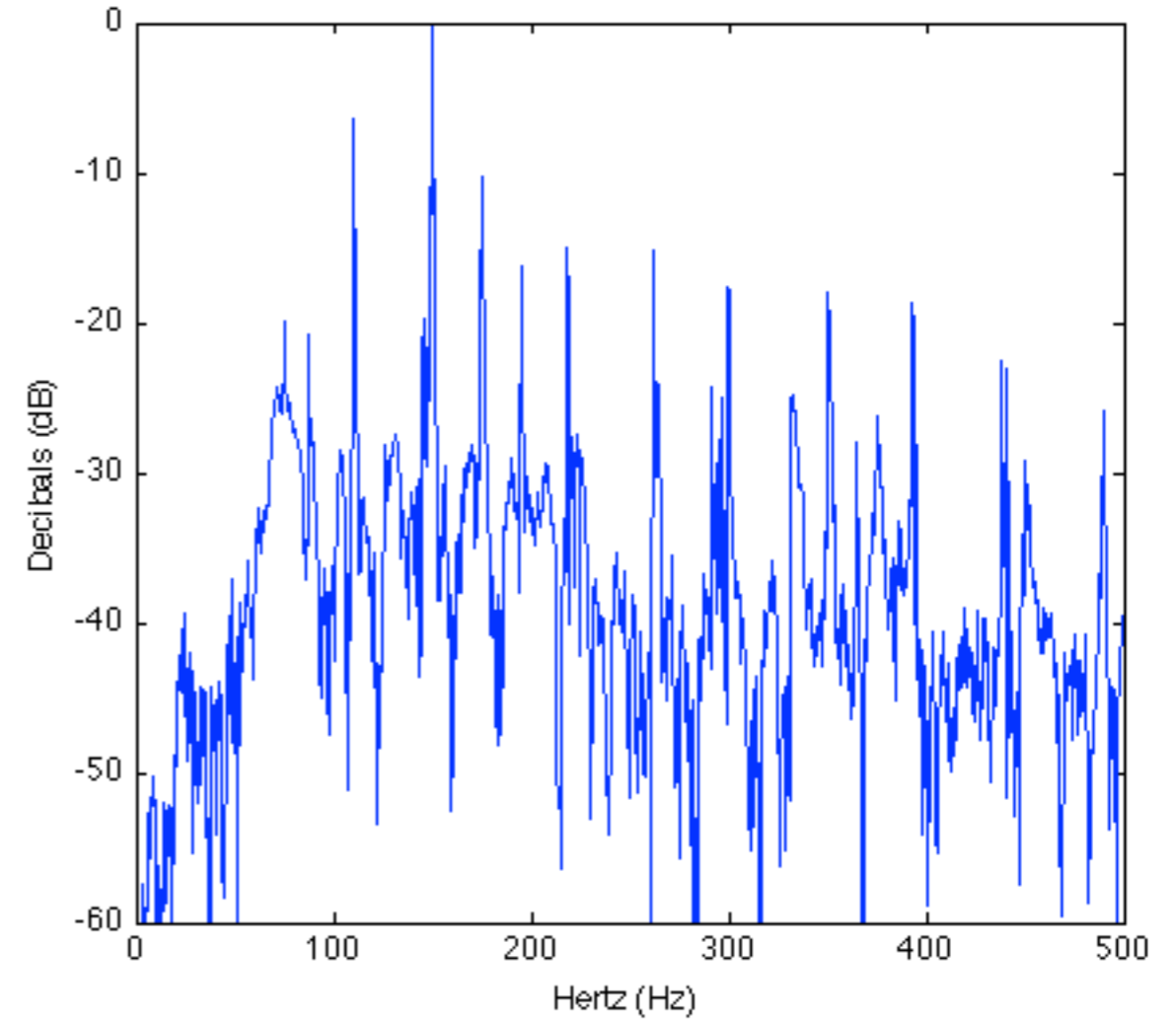
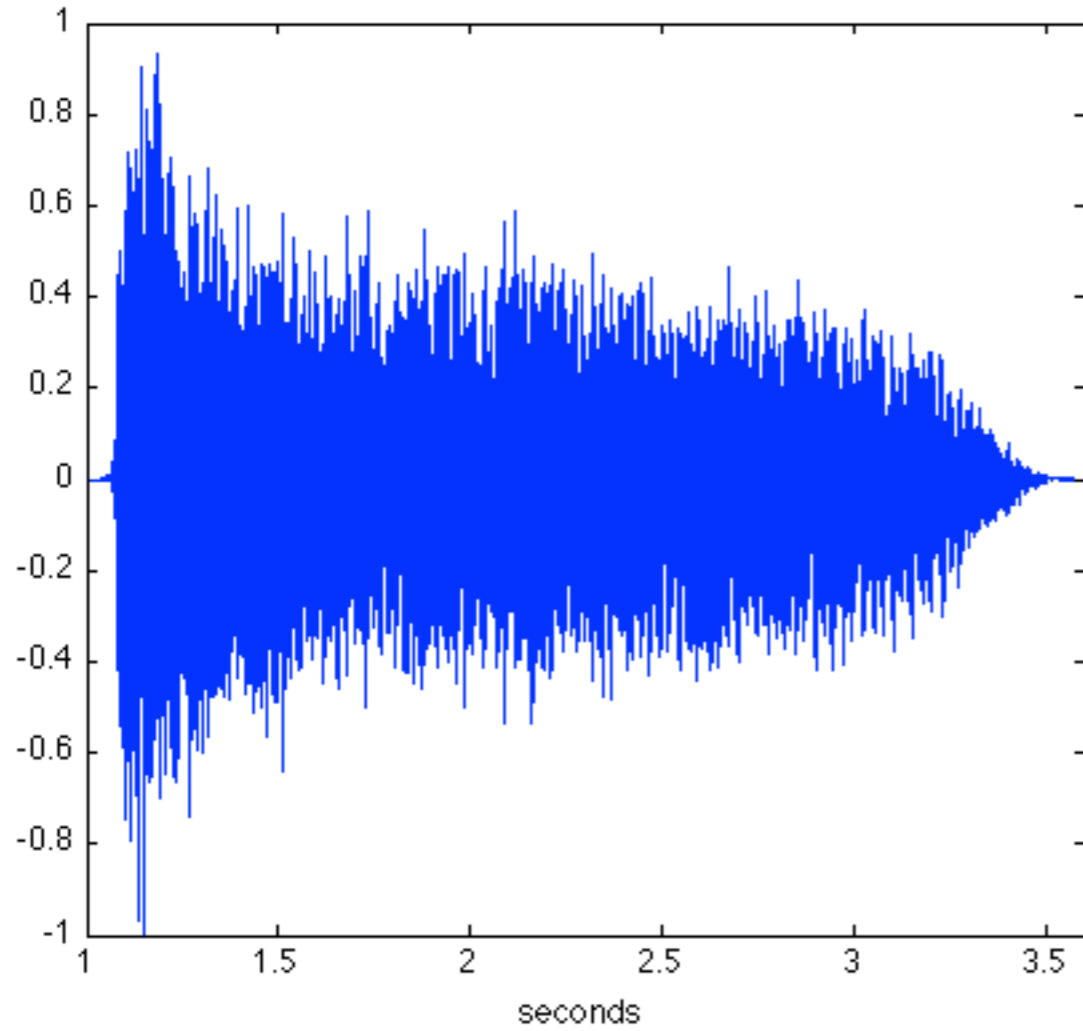


“I’ve got a bad feeling about this..”

Sounds as waveforms

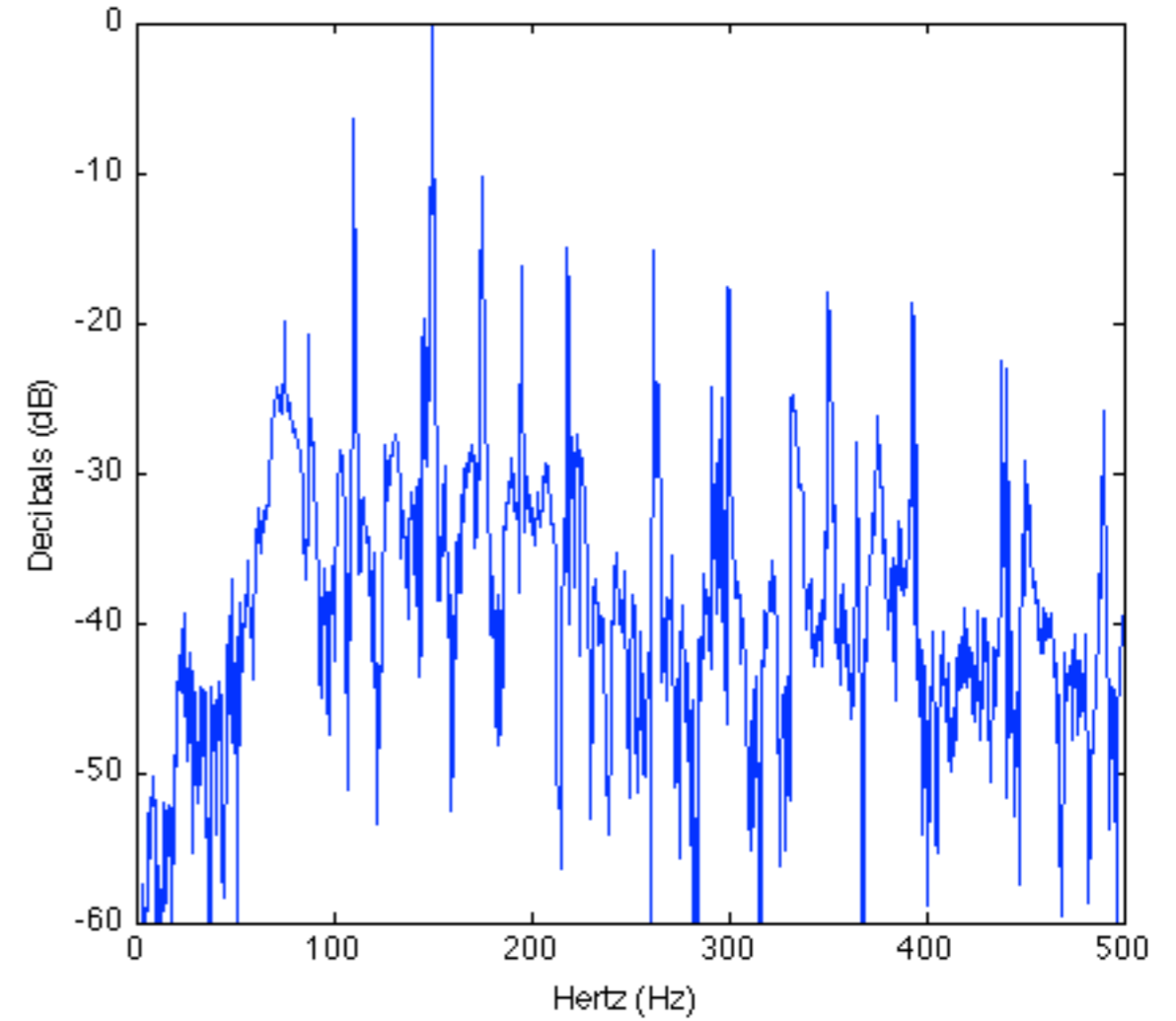
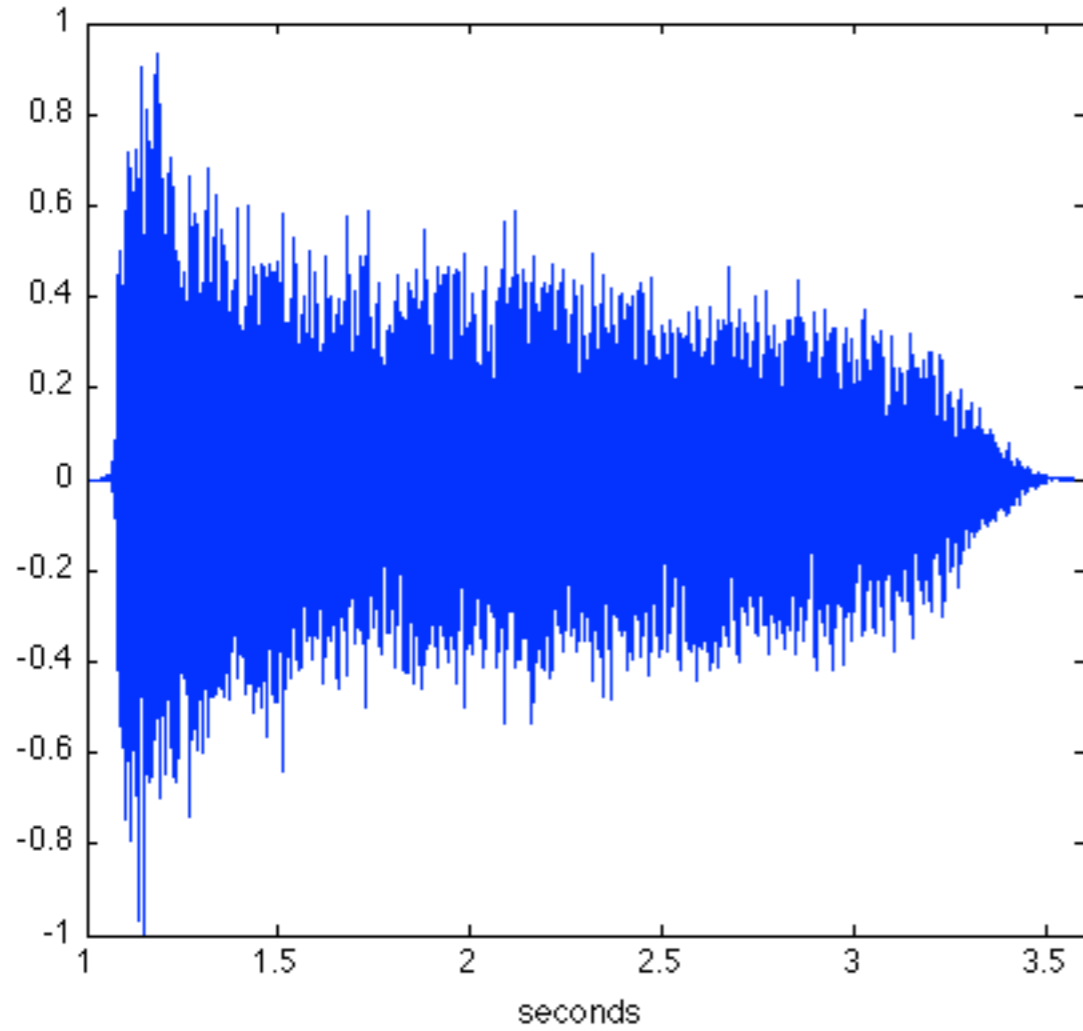


Frequency



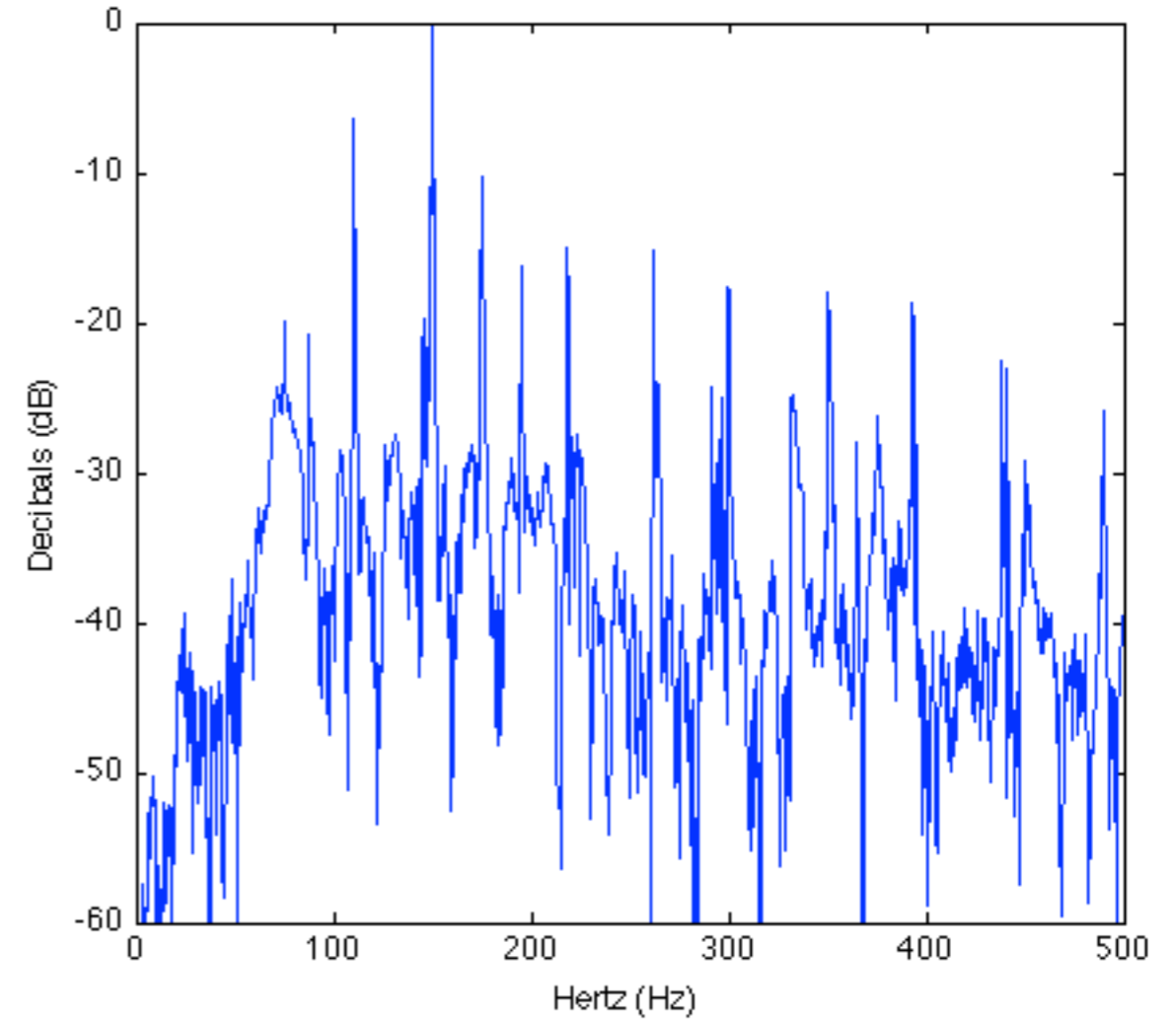
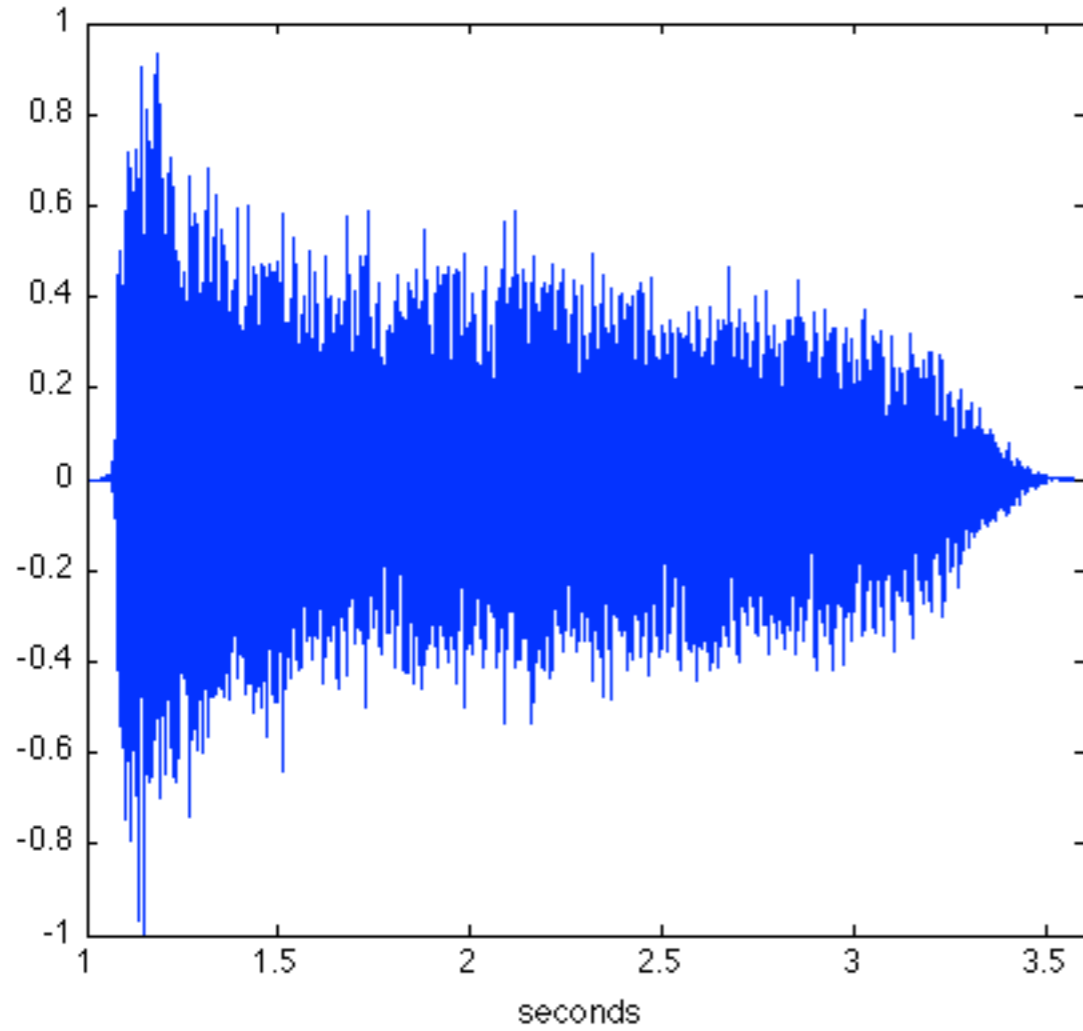
Recognize this?

Frequency



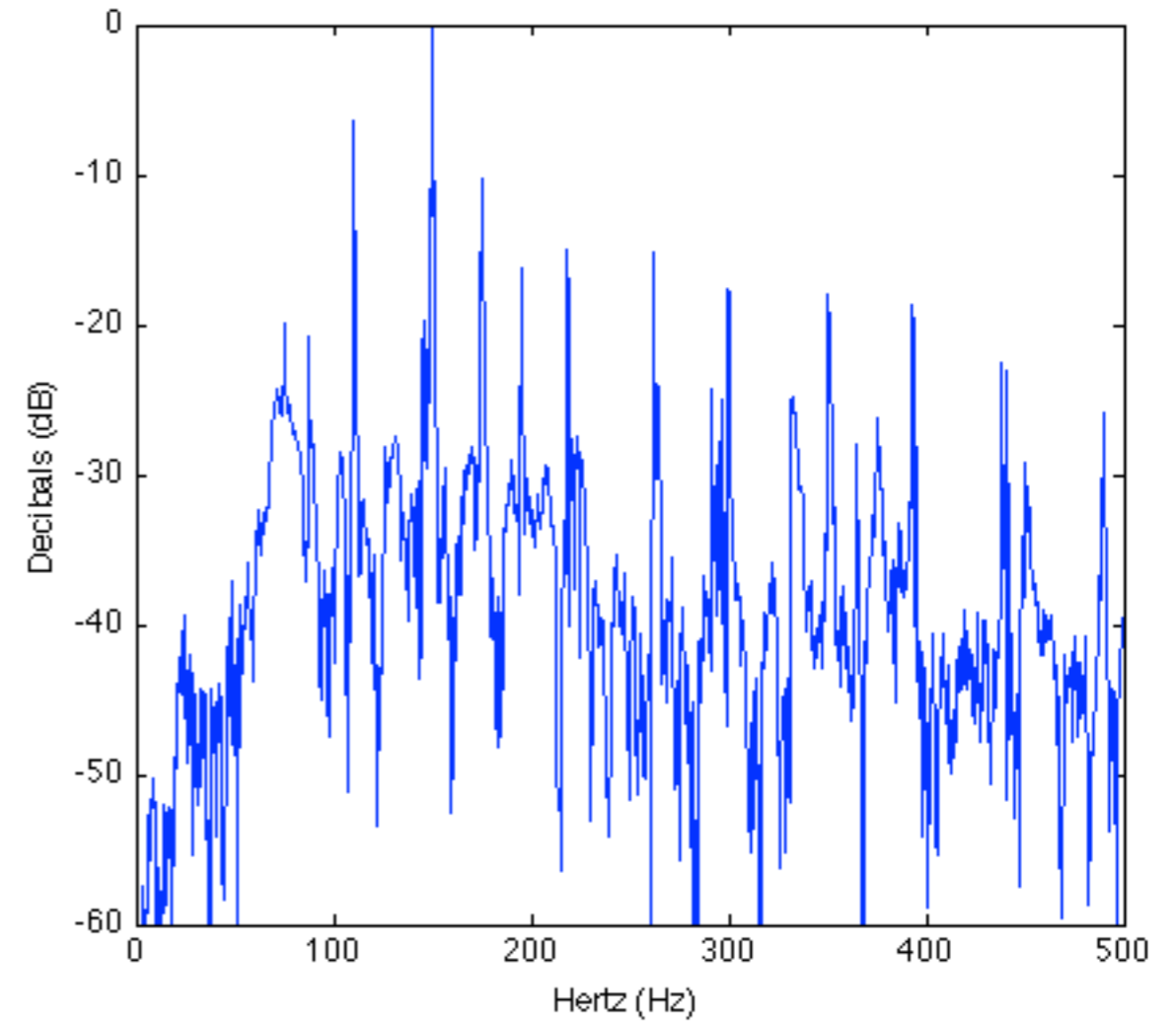
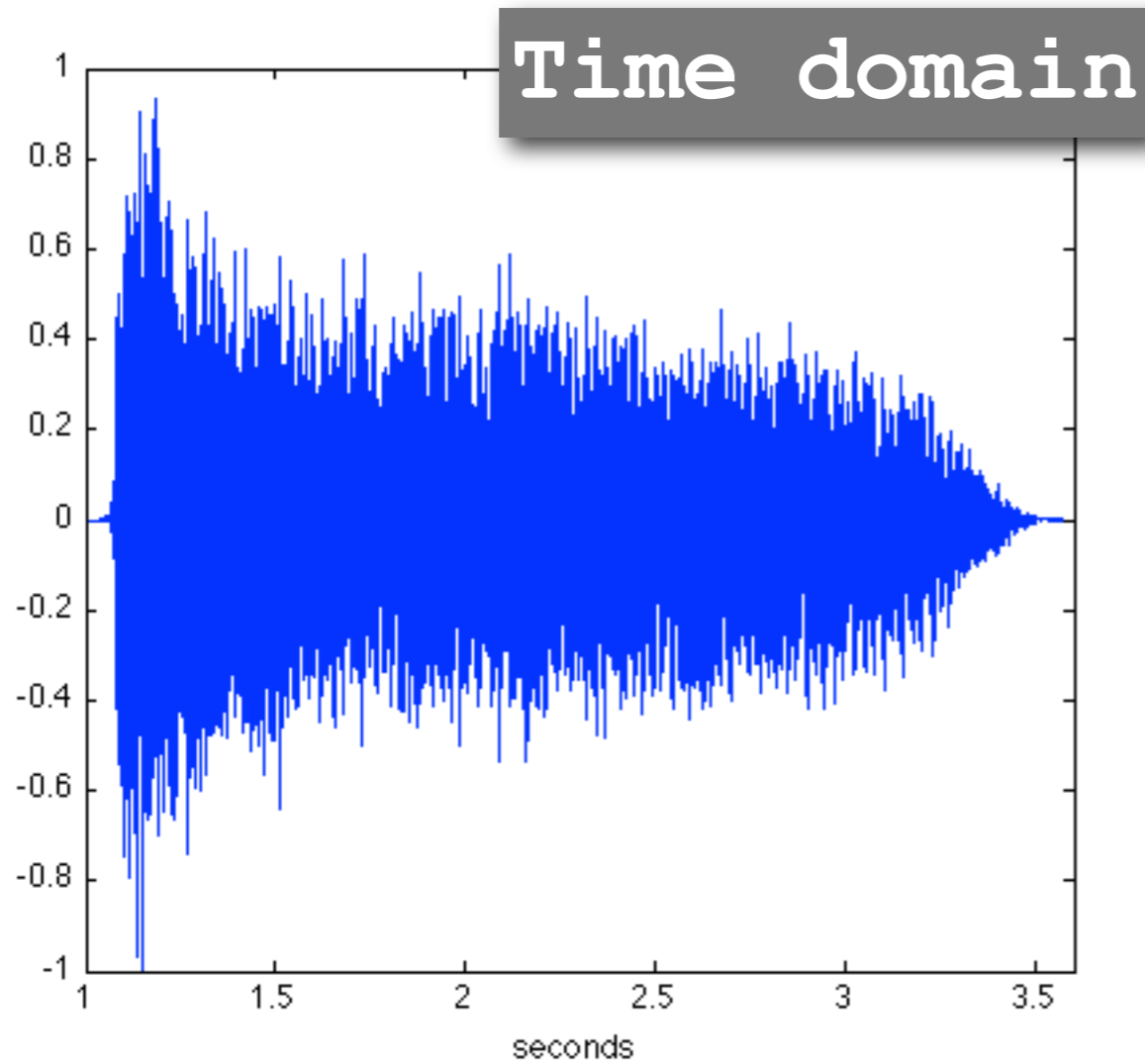
Recognize this?

Frequency



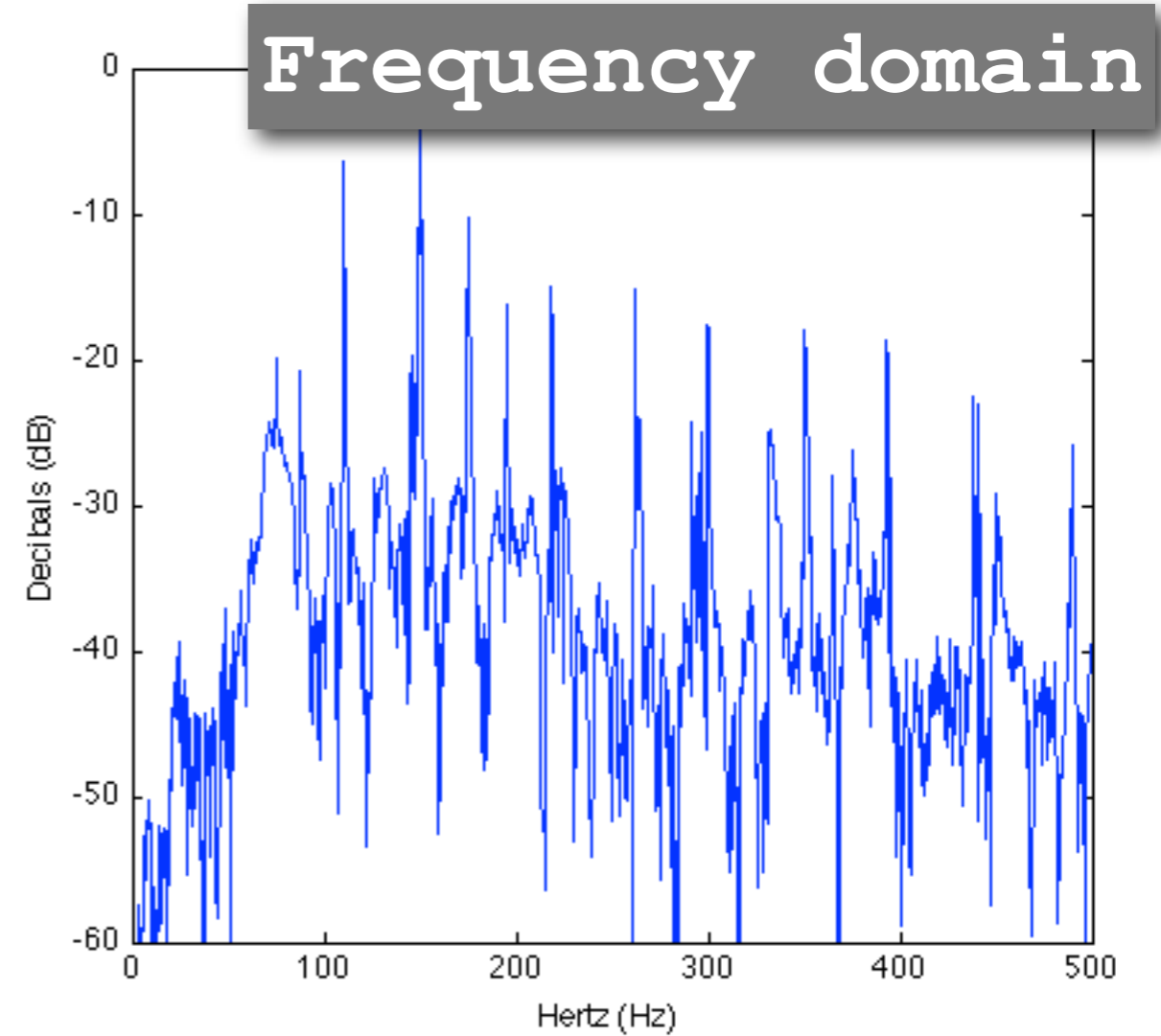
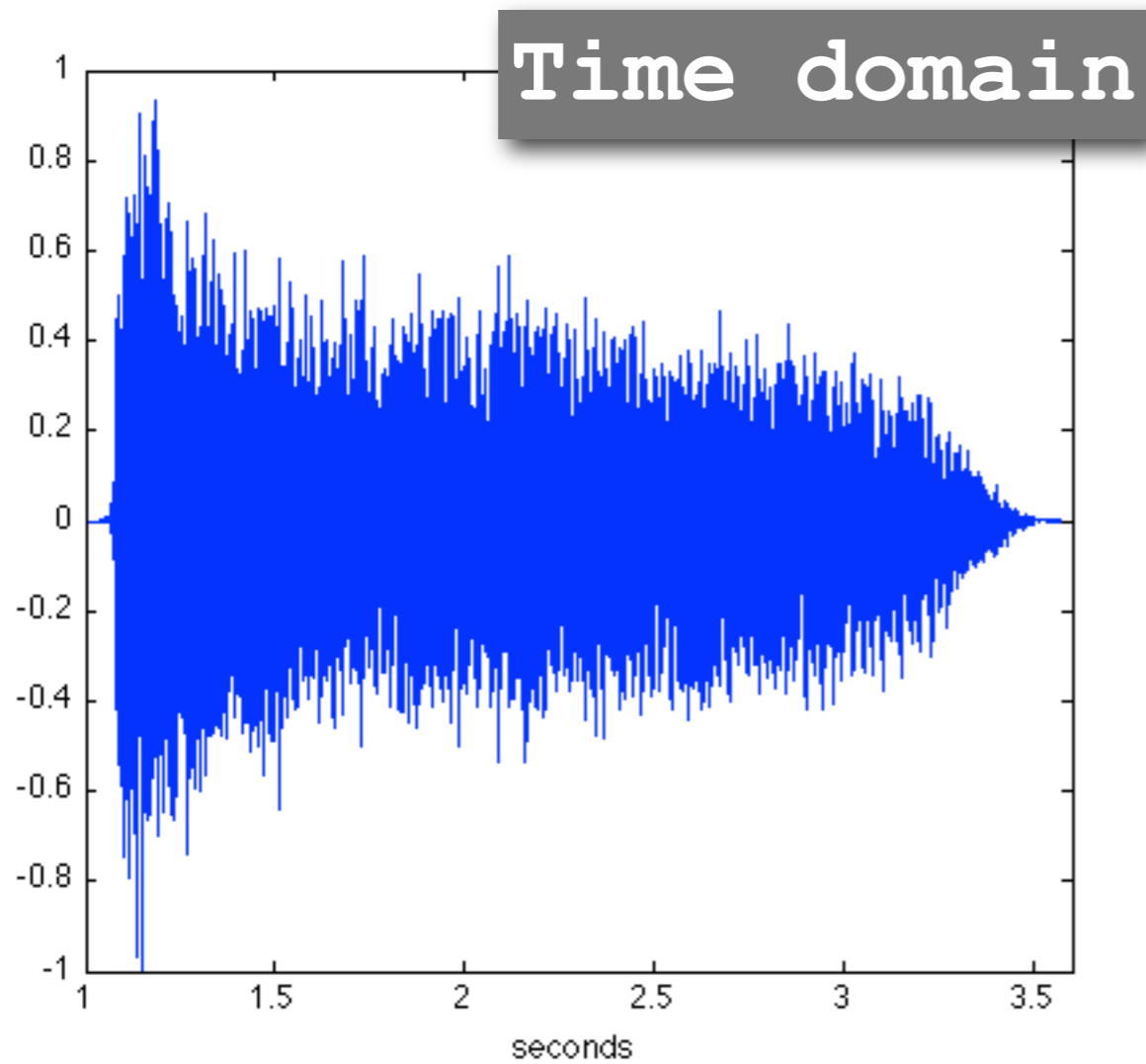
Recognize this?

Frequency



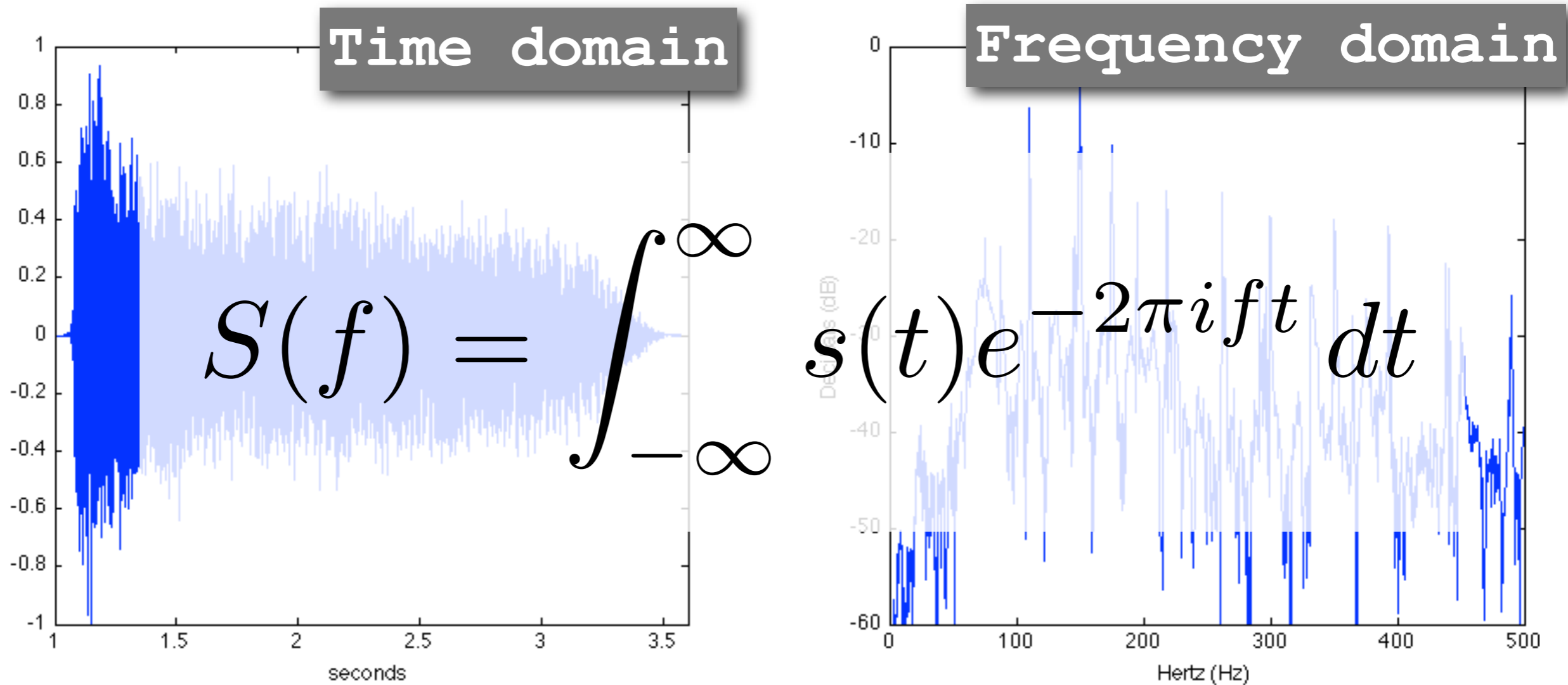
Recognize this?

Frequency



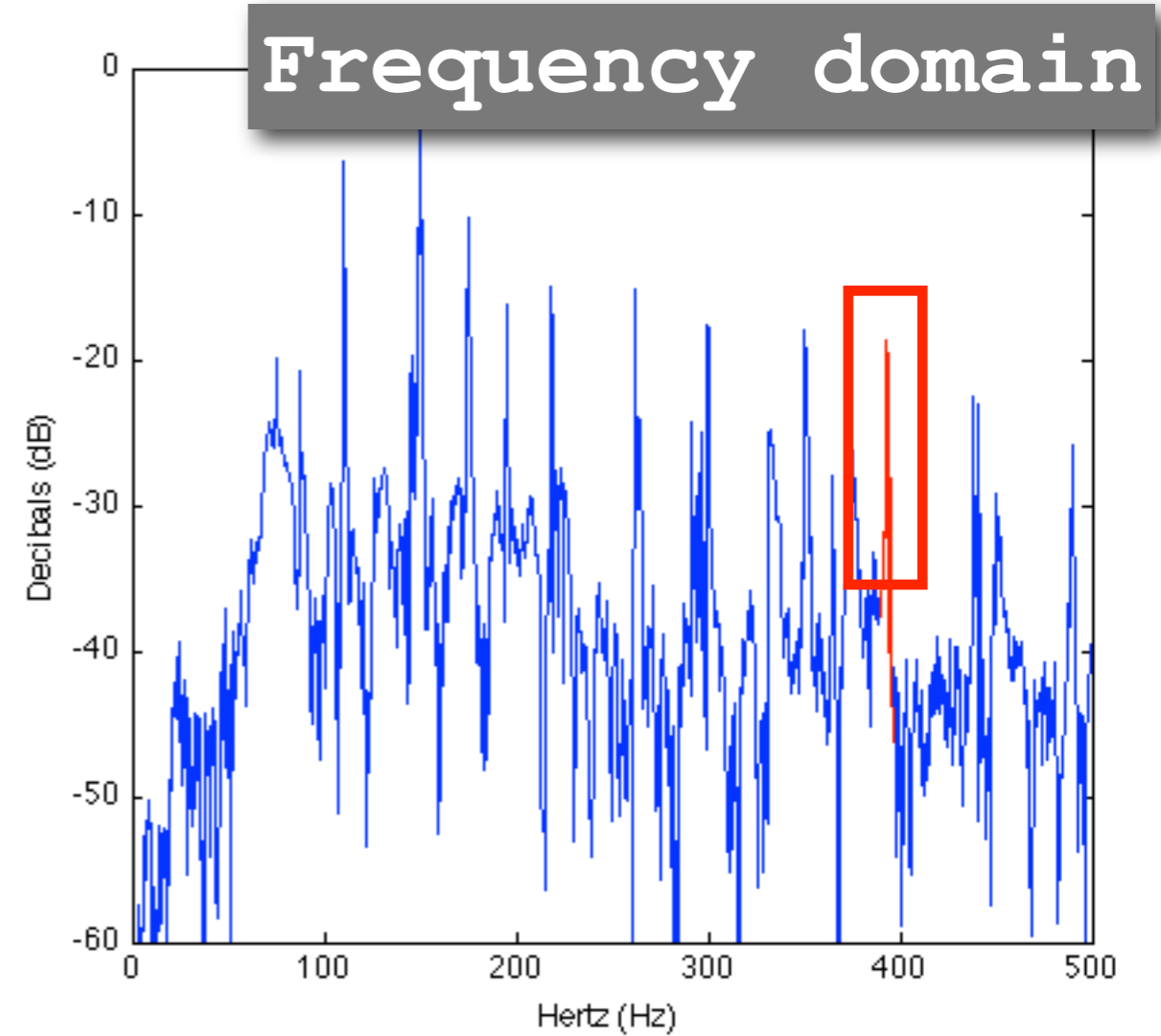
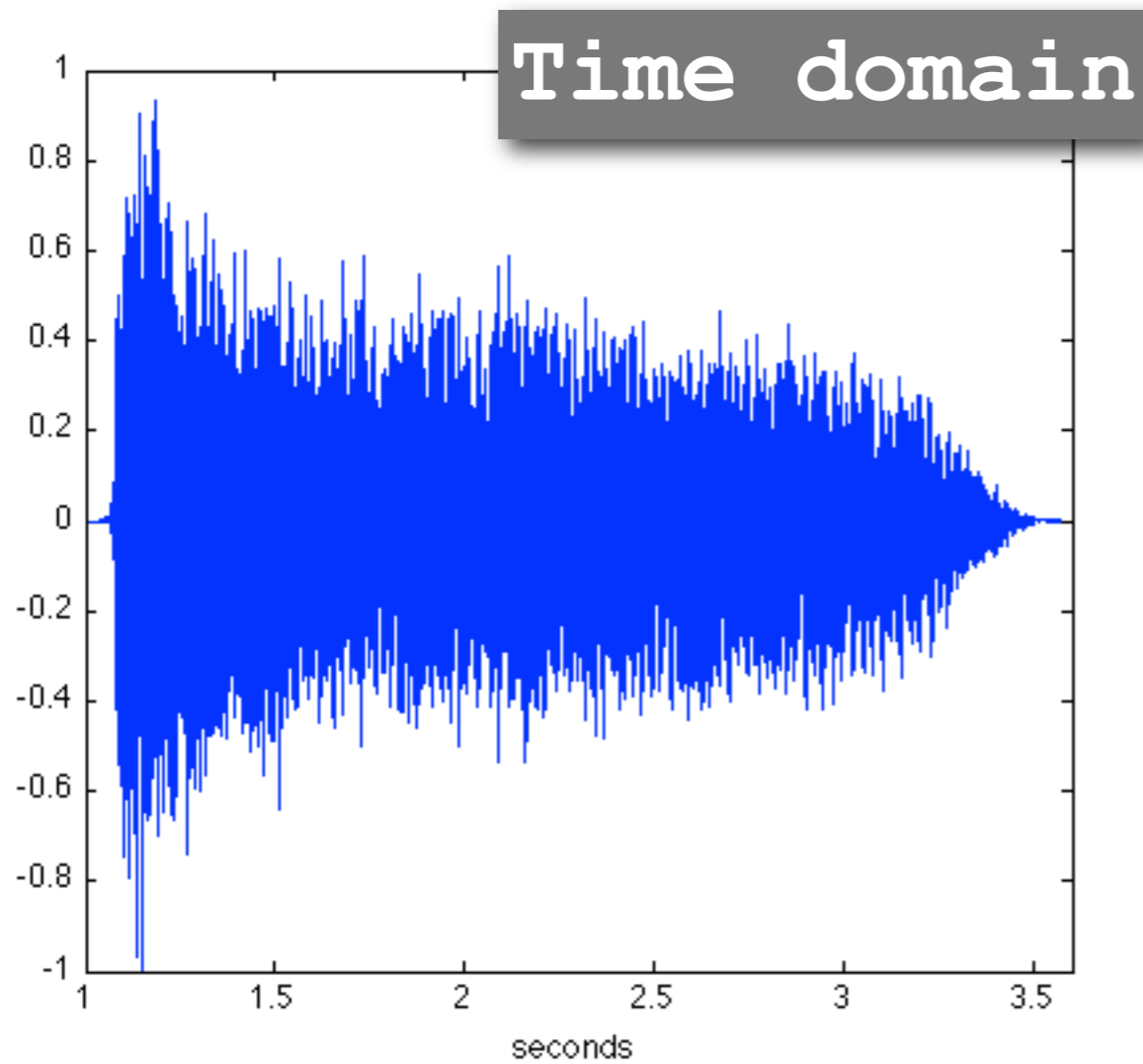
Recognize this?

Frequency



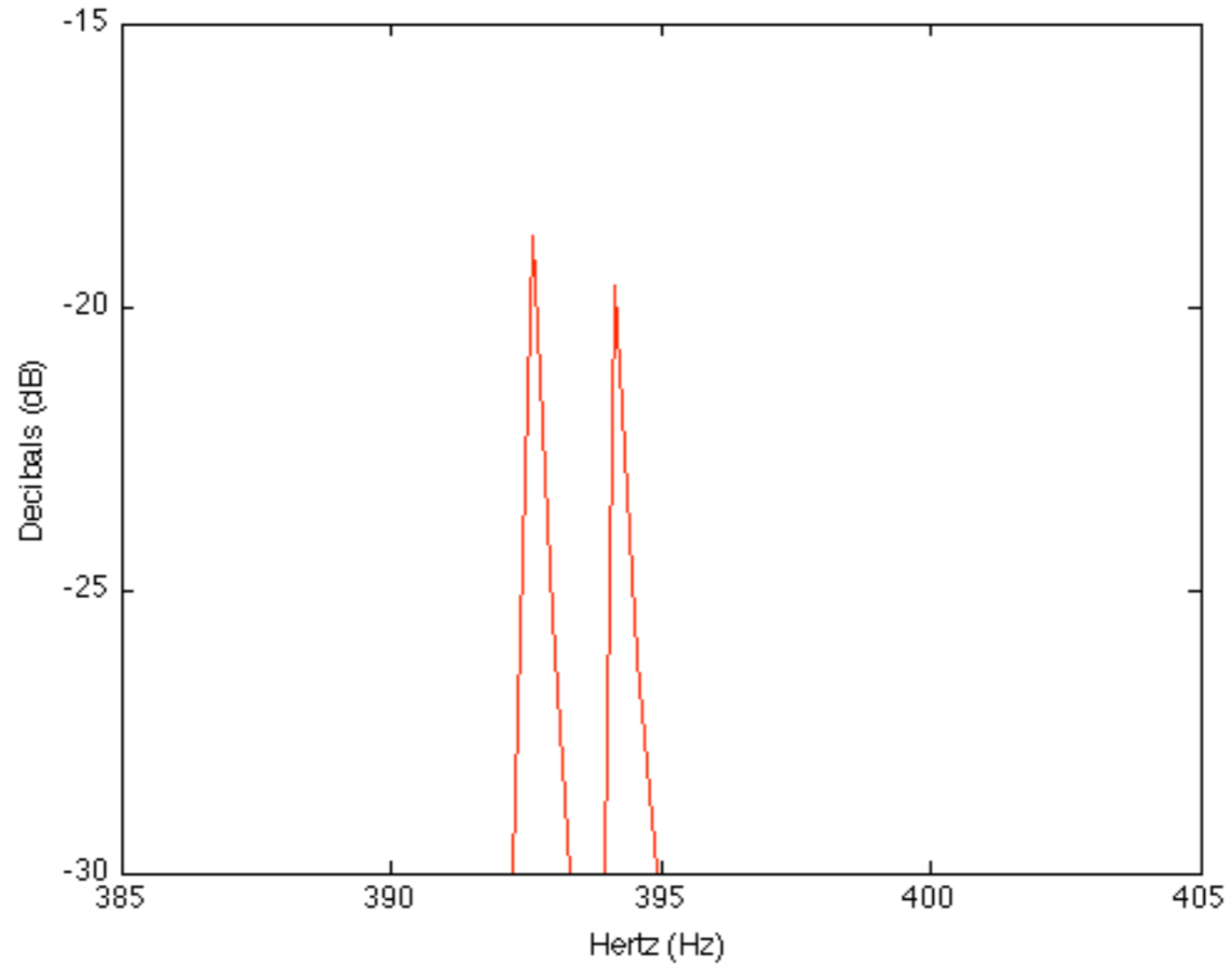
Recognize this?

Frequency

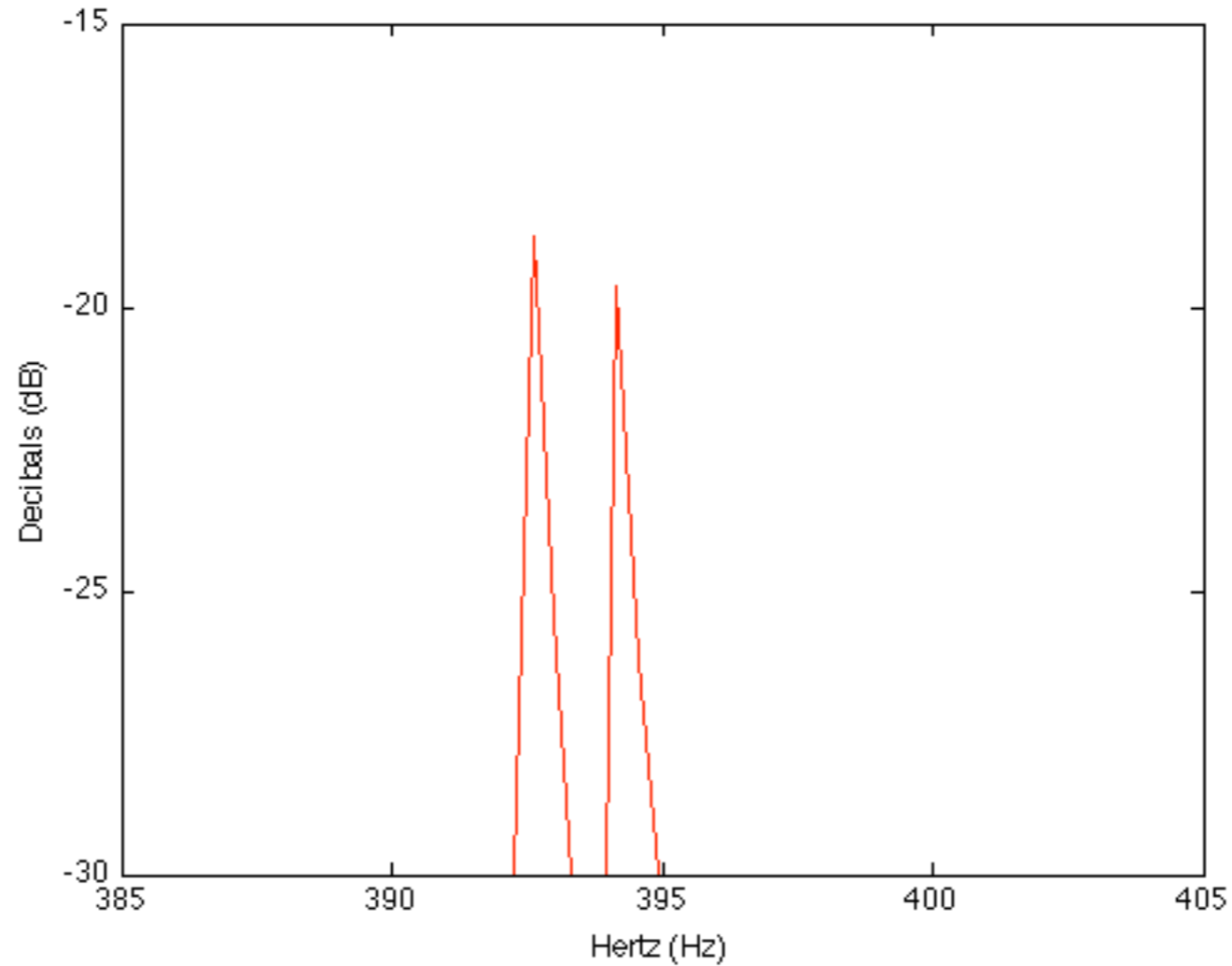


Recognize this?

Frequency

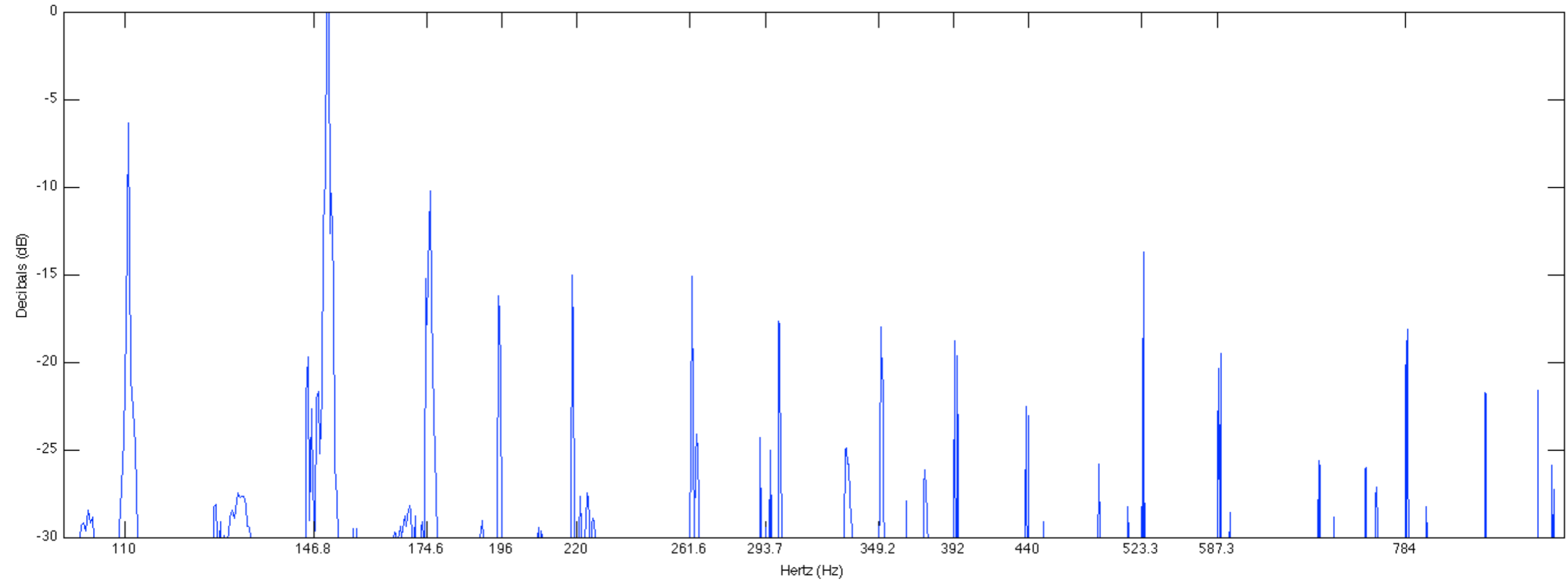


Frequency

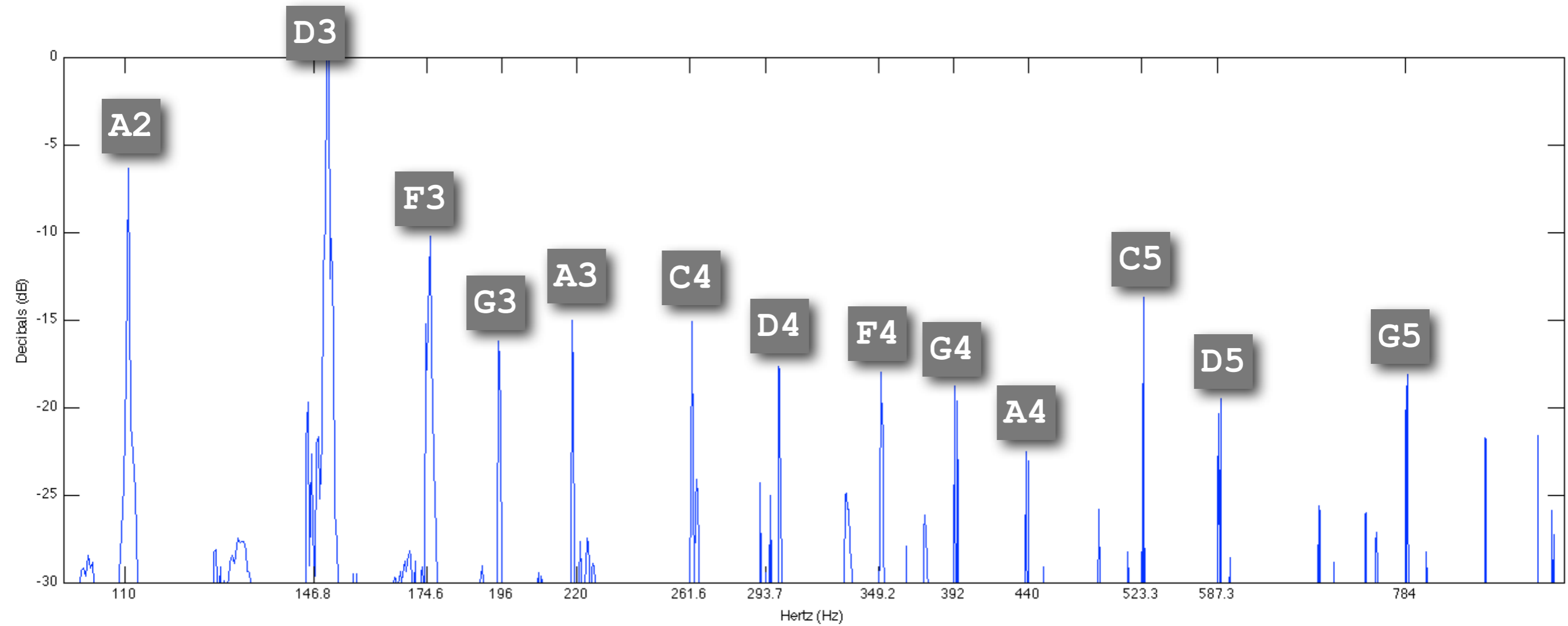


George played a 12-string guitar!

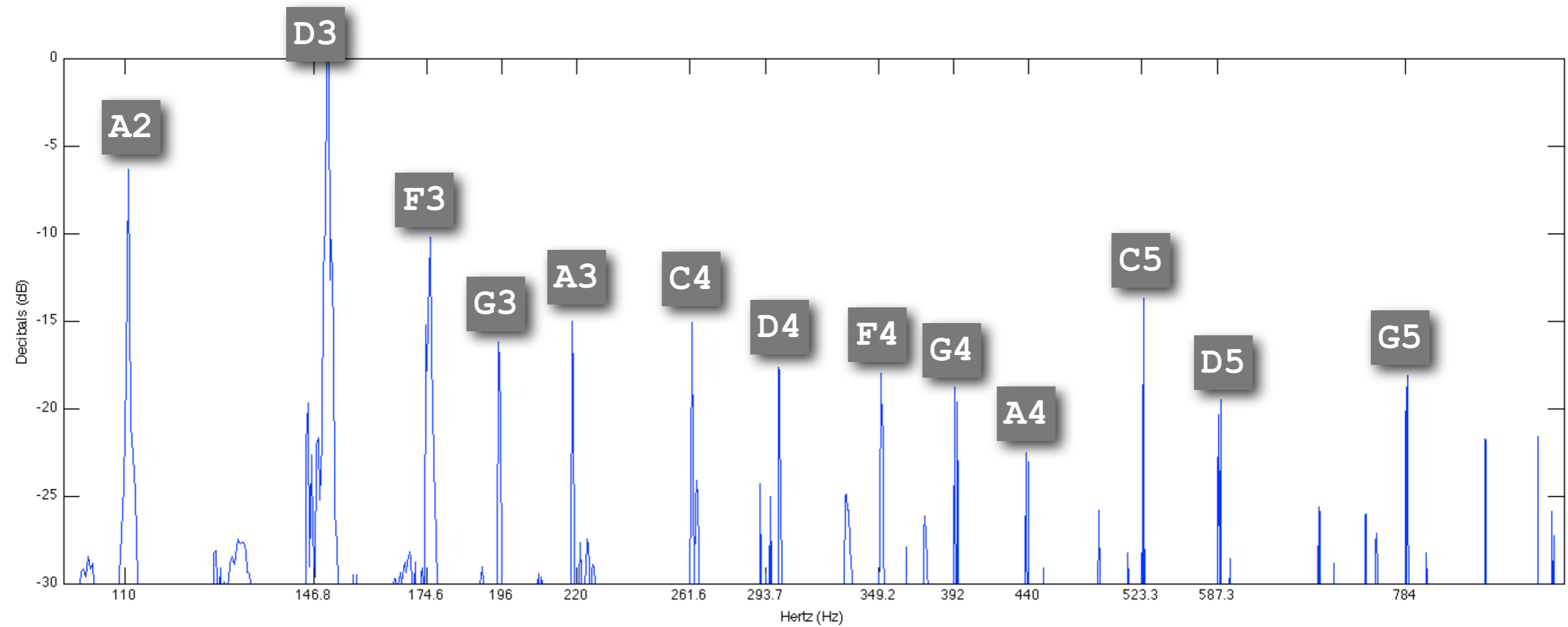
Some Detective Work



Some Detective Work



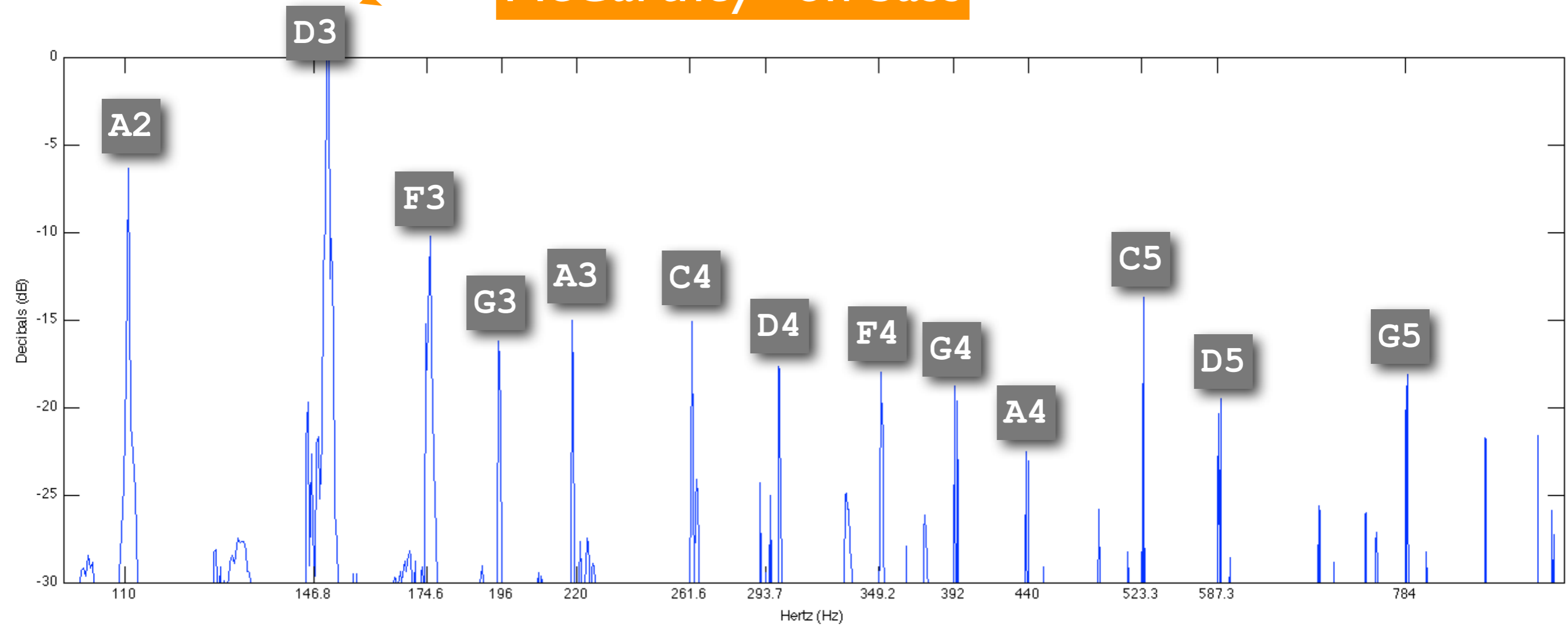
Some Detective Work



F major pentatonic scale / D bass

Some Detective Work

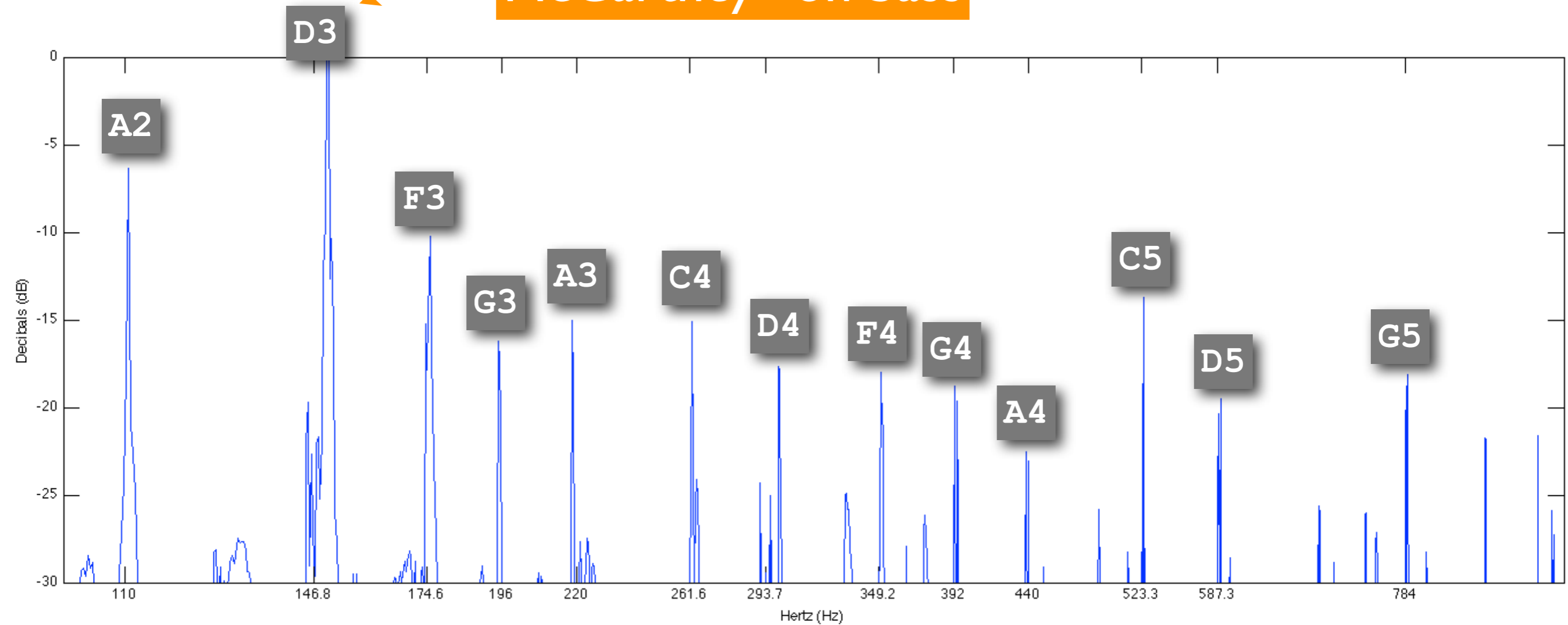
McCartney* on bass



F major pentatonic scale / D bass

Some Detective Work

McCartney* on bass



F major pentatonic scale / D bass

* = favorite Beatle

Pure Tones

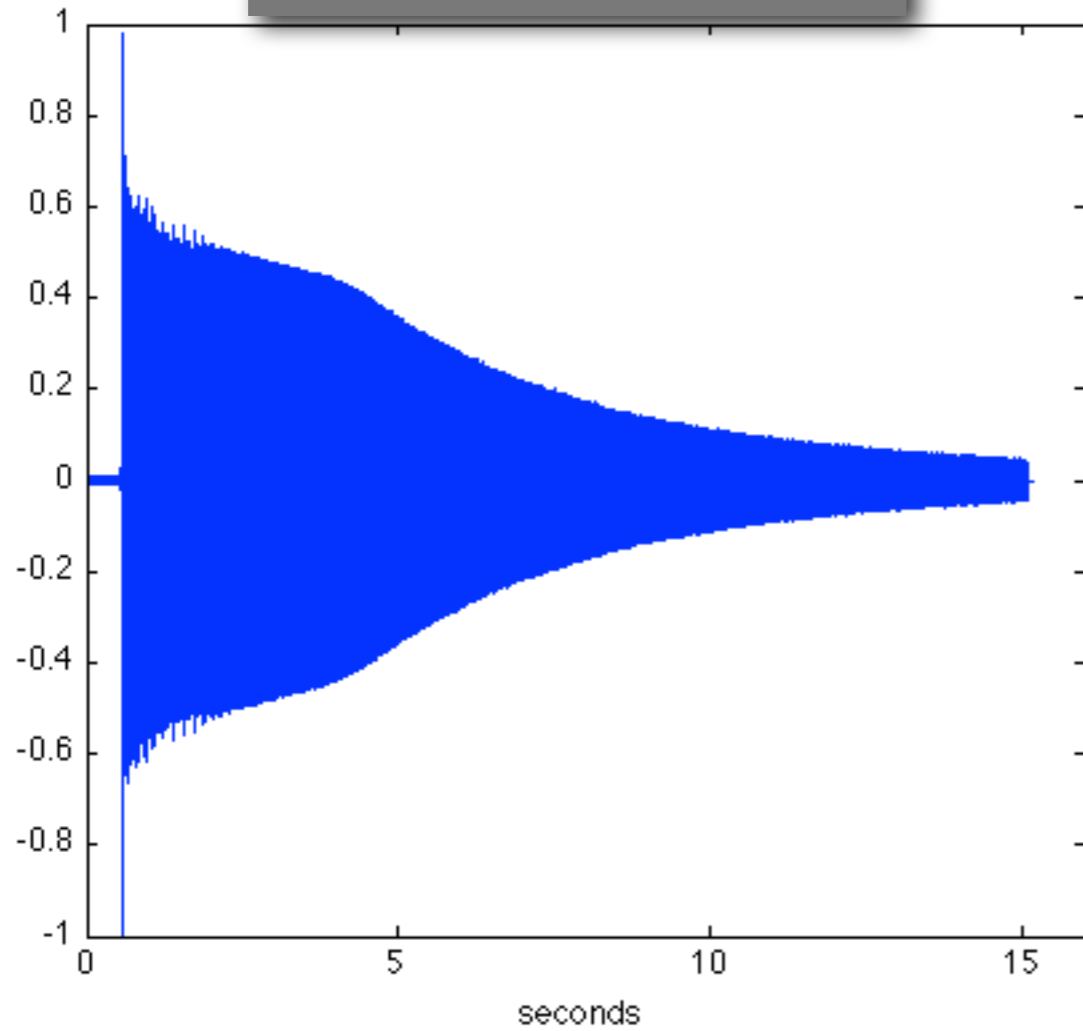


Pure Tones

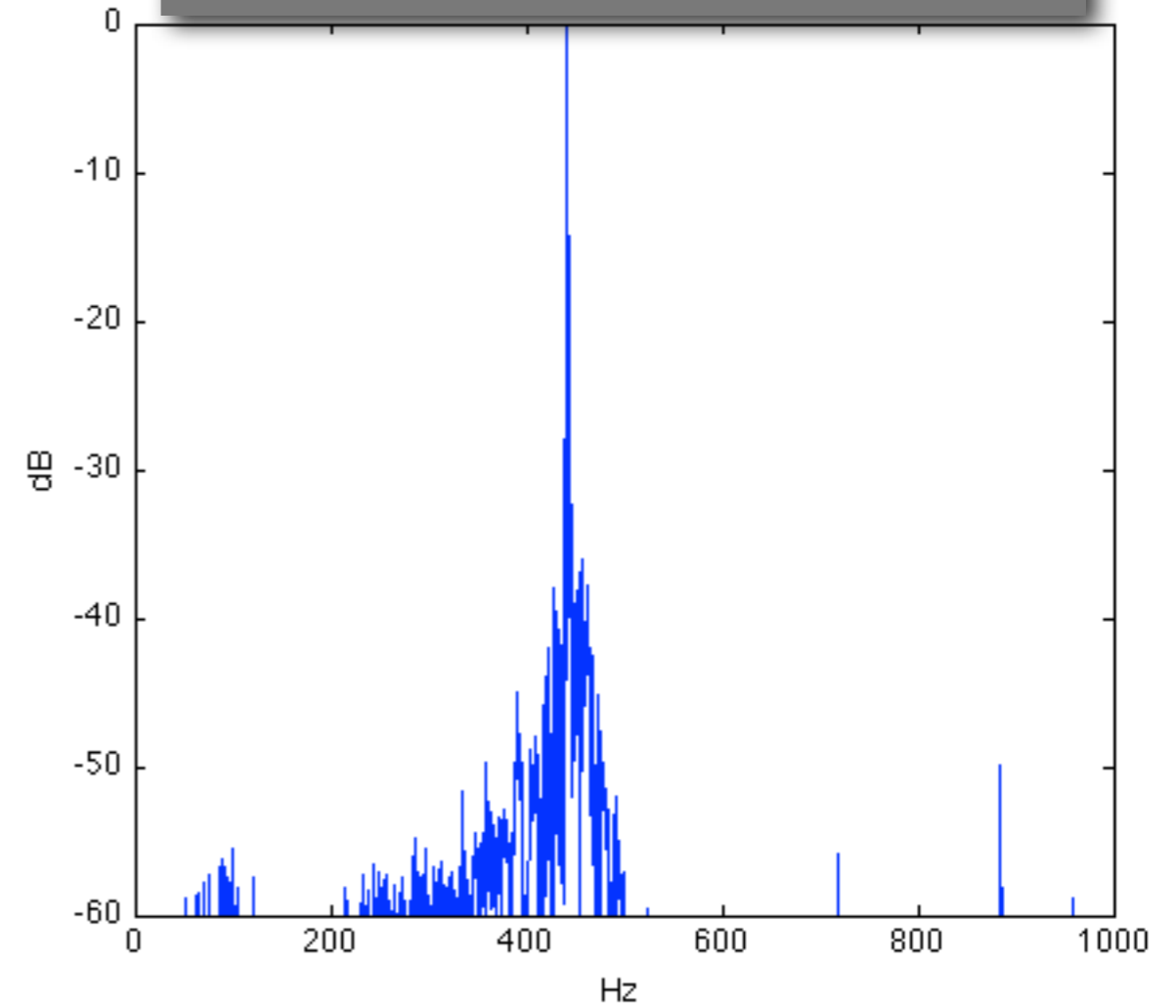


Pure Tones

Time domain

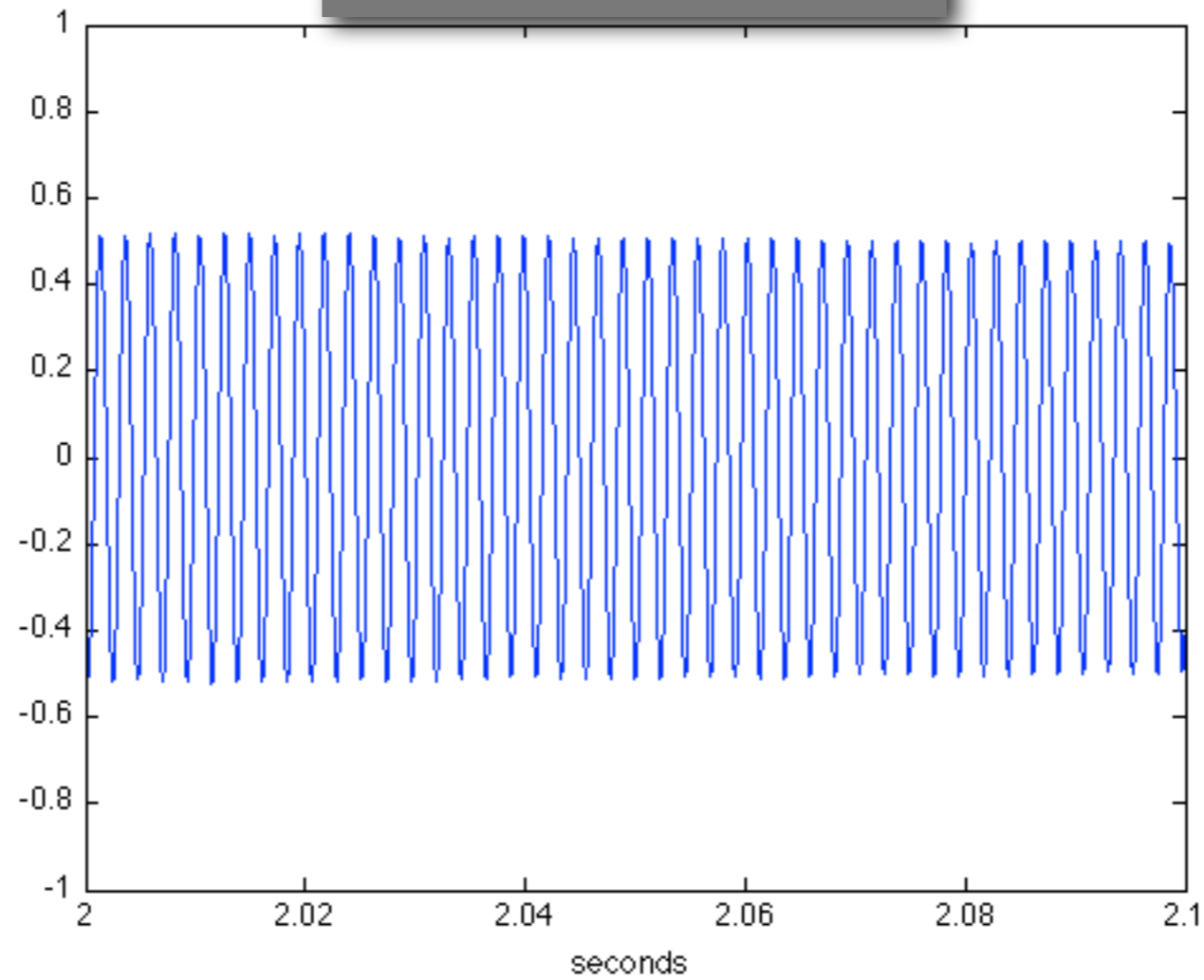


Frequency domain



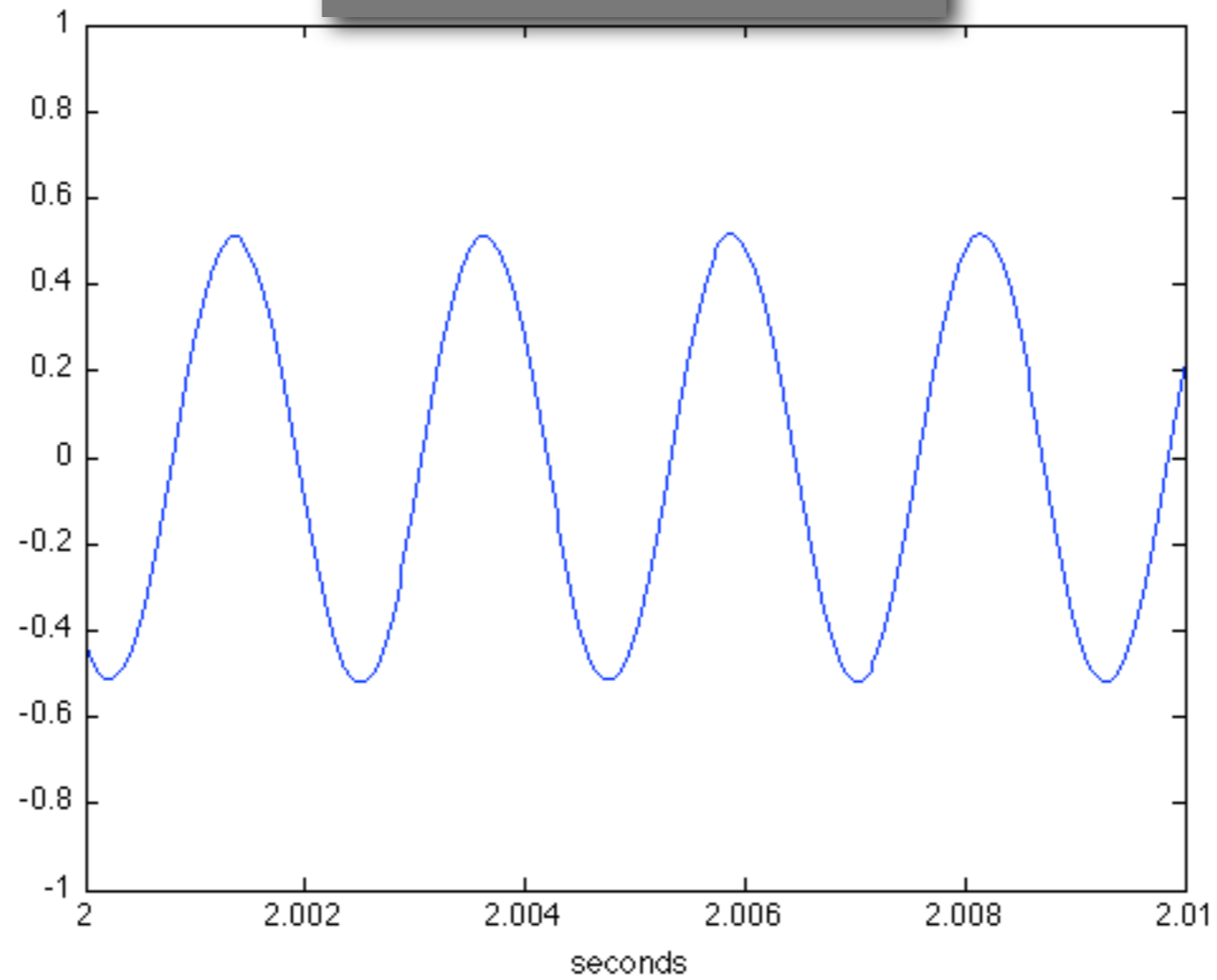
Pure Tones

Time domain

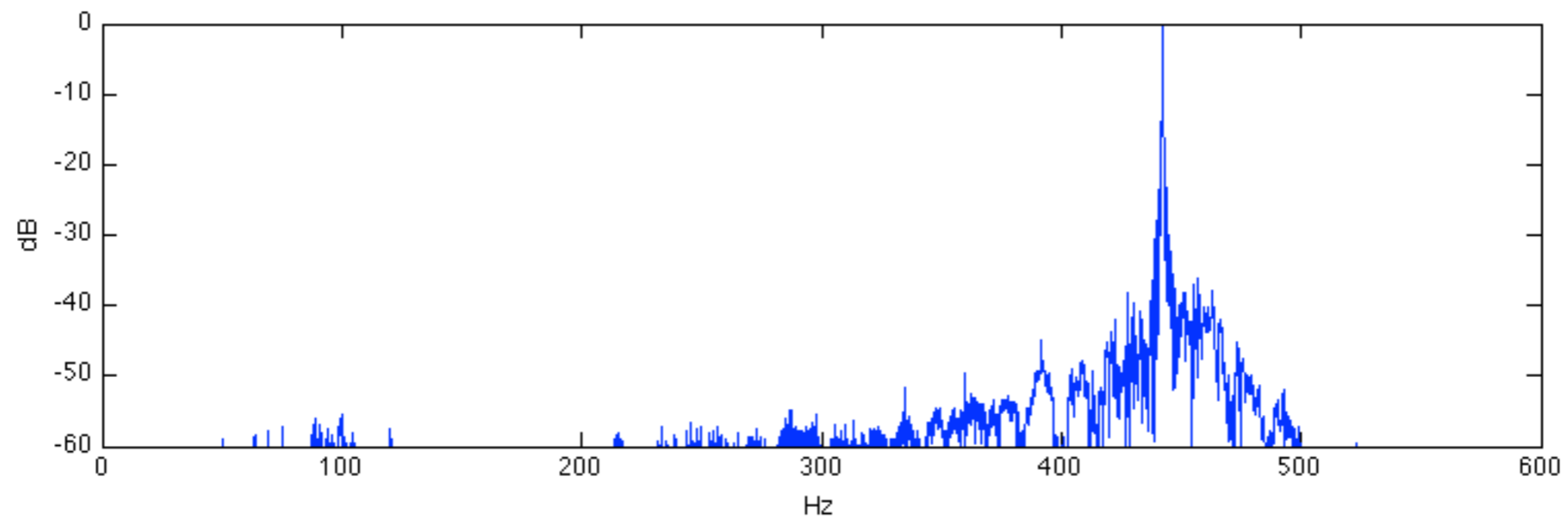
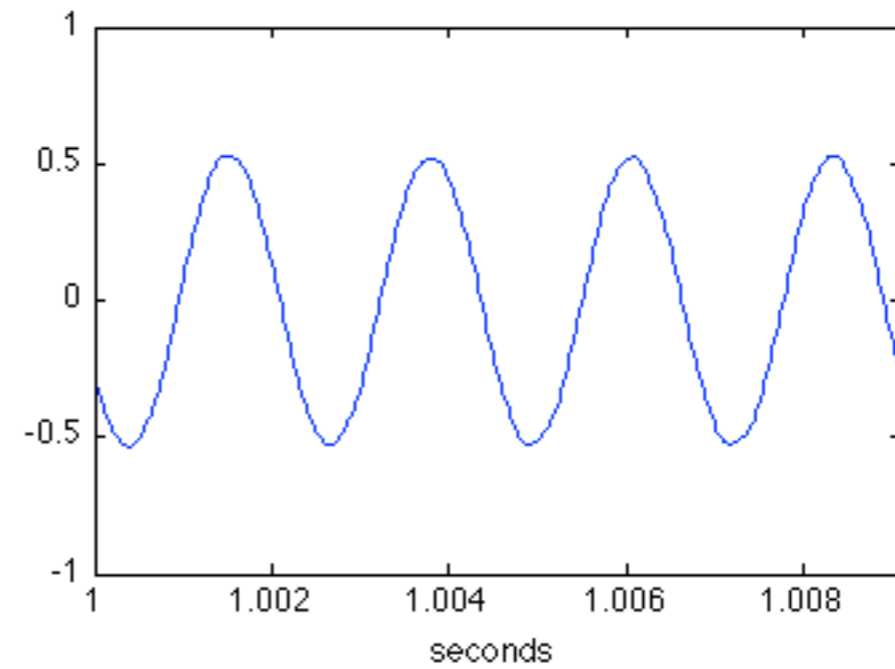
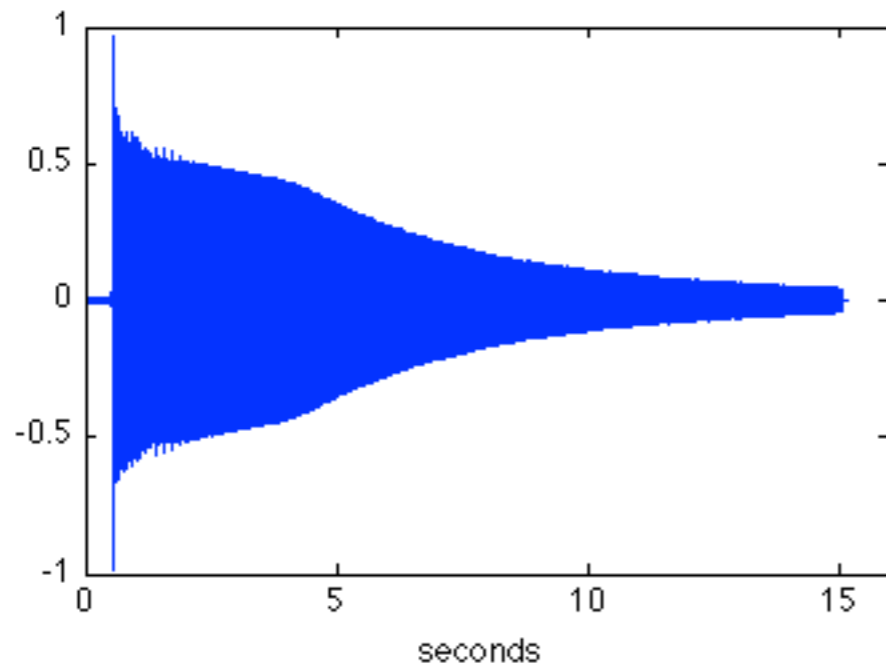


Pure Tones

Time domain



Pure Tones



Pure Tones


- ▶ Definition: a pure tone is a function of the form

$$s(t) = A \cos(2\pi f_0 t + \phi)$$

Pure Tones

- ▶ Definition: a pure tone is a function of the form

amplitude

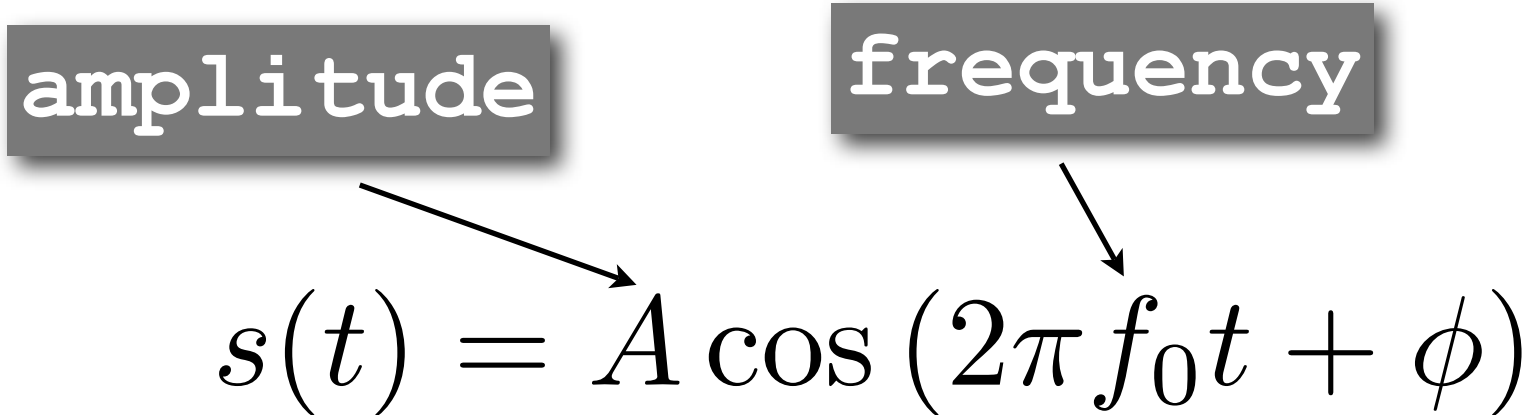

$$s(t) = A \cos(2\pi f_0 t + \phi)$$

Pure Tones

- ▶ Definition: a pure tone is a function of the form

amplitude

frequency


$$s(t) = A \cos(2\pi f_0 t + \phi)$$

Pure Tones

- ▶ Definition: a pure tone is a function of the form

The diagram illustrates the components of the pure tone equation $s(t) = A \cos(2\pi f_0 t + \phi)$. Three labels in grey boxes are positioned above the equation: 'amplitude' is above the variable A , 'frequency' is above the term $2\pi f_0$, and 'phase' is above the variable ϕ . Arrows point from each label to its corresponding variable in the equation.

$$s(t) = A \cos(2\pi f_0 t + \phi)$$

Pure Tones

- ▶ Definition: a pure tone is a function of the form

The diagram illustrates the components of a pure tone equation. Three grey boxes labeled 'amplitude', 'frequency', and 'phase' are positioned above the equation. Arrows point from each box to its corresponding parameter in the equation: 'amplitude' points to 'A', 'frequency' points to 'f₀', and 'phase' points to 'φ'.

$$s(t) = A \cos(2\pi f_0 t + \phi)$$
$$= a \cos(2\pi f_0 t) + b \sin(2\pi f_0 t)$$

Simulated Tuning Fork

- ▶ Simulate a tuning fork by enveloping a pure tone with a time-varying amplitude:

$$s(t) = A(t) \cos(2\pi f_0 t + \phi)$$

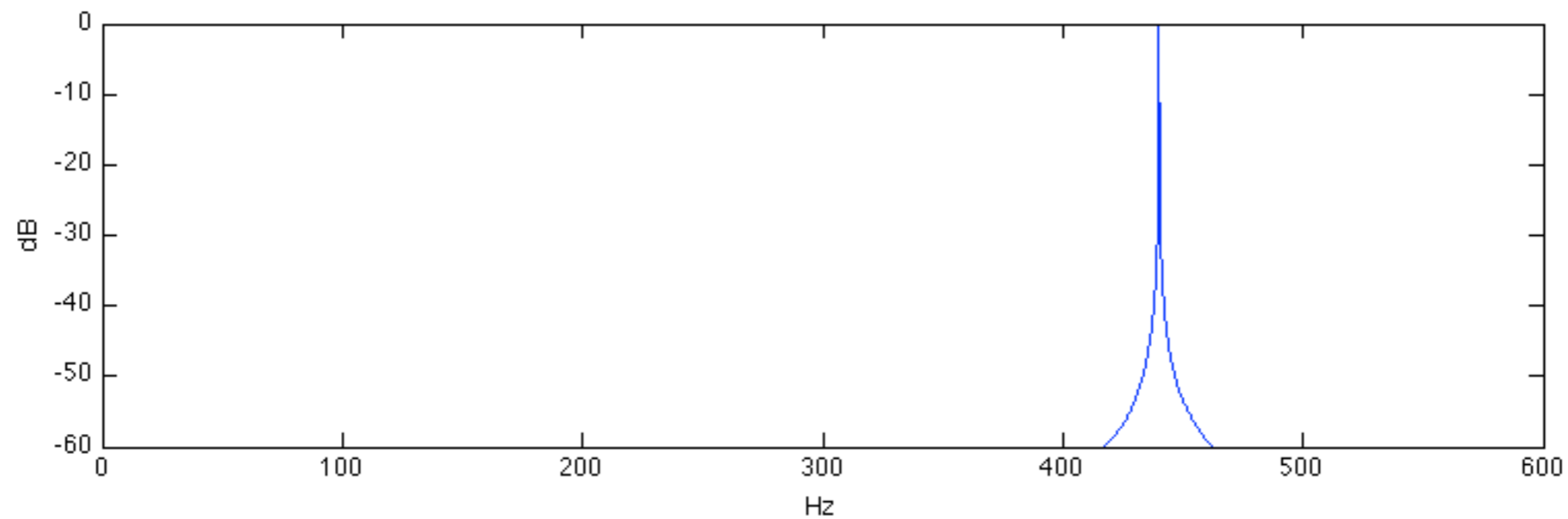
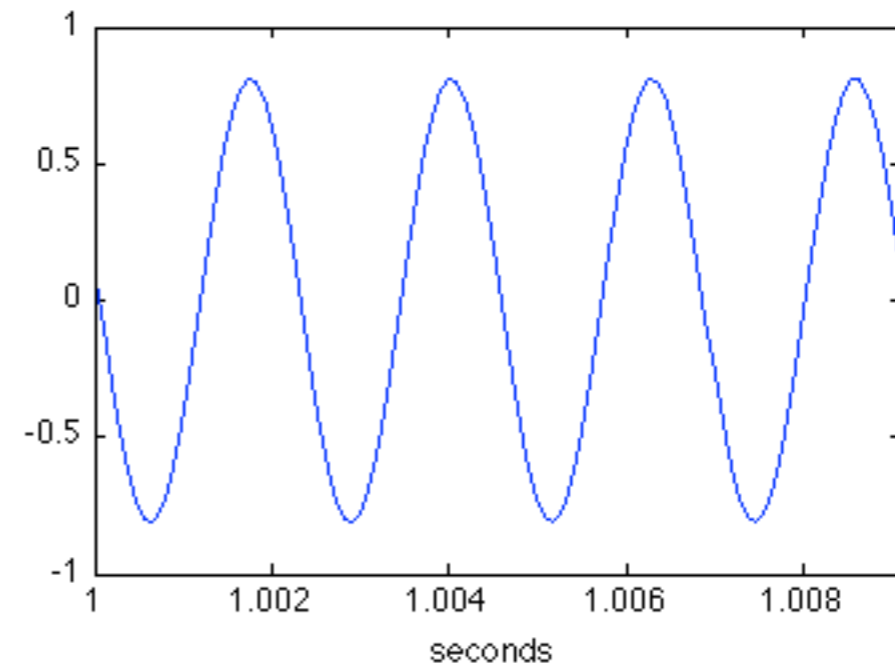
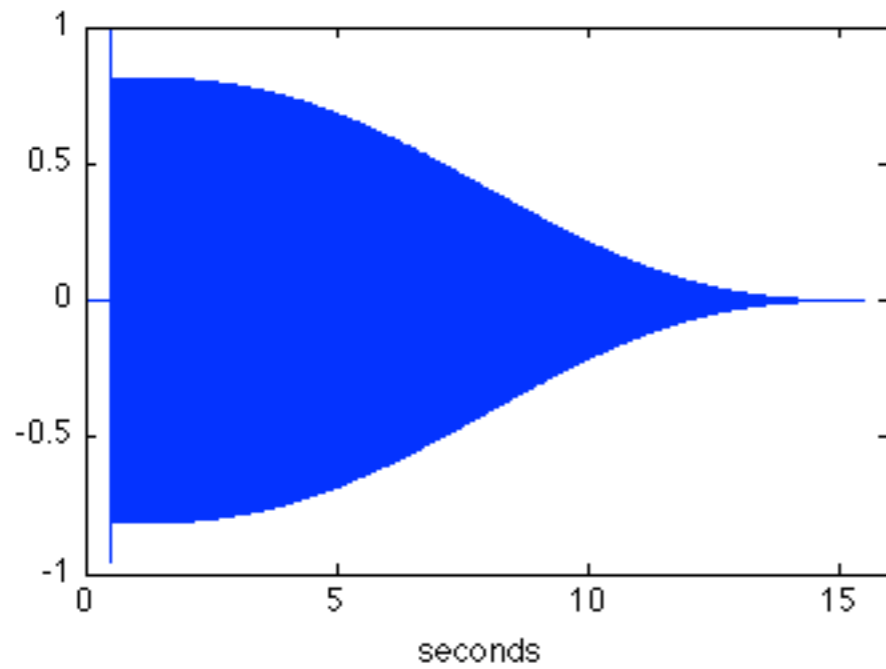
Simulated Tuning Fork

- ▶ Simulate a tuning fork by enveloping a pure tone with a time-varying amplitude:

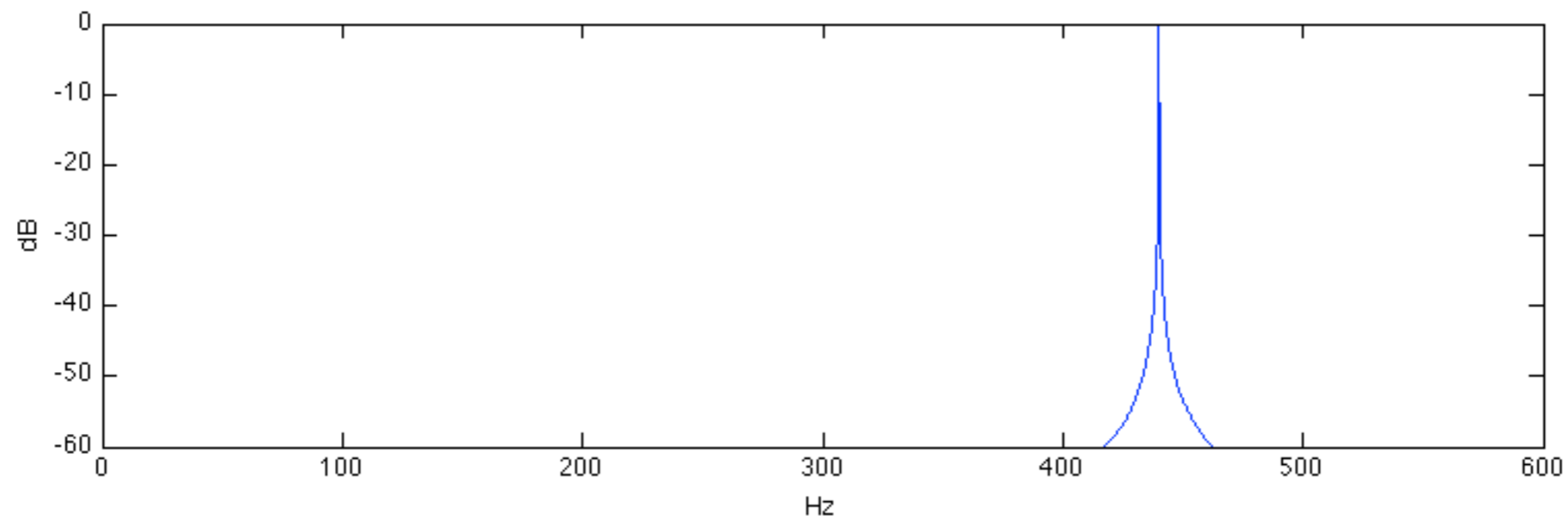
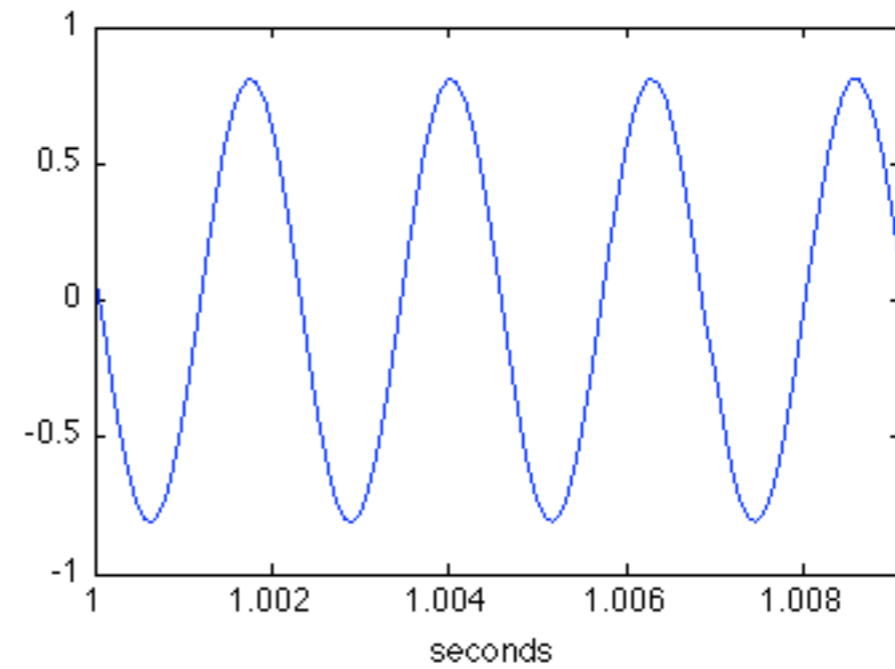
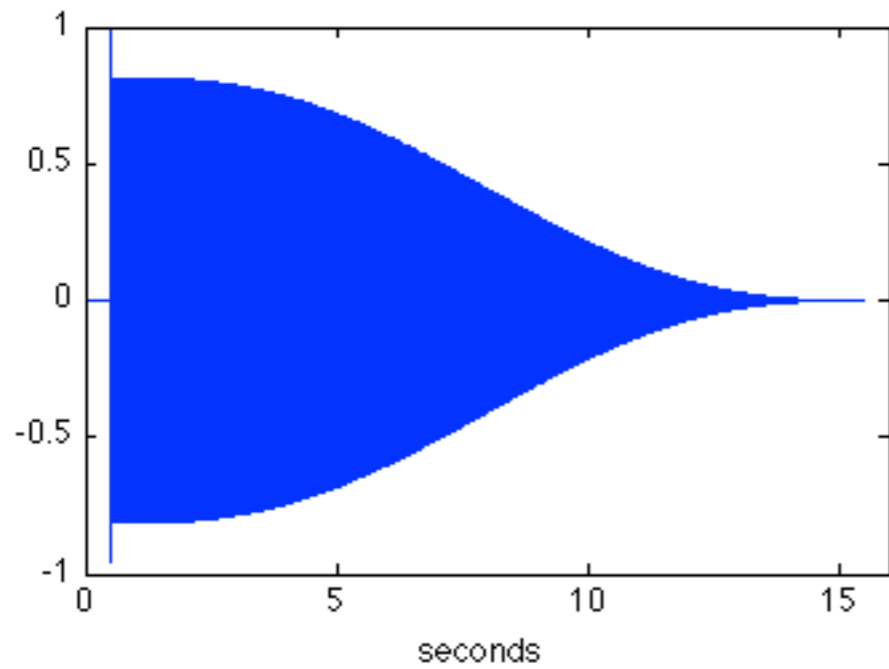
time-varying amplitude


$$s(t) = A(t) \cos(2\pi f_0 t + \phi)$$

Simulated Tuning Fork

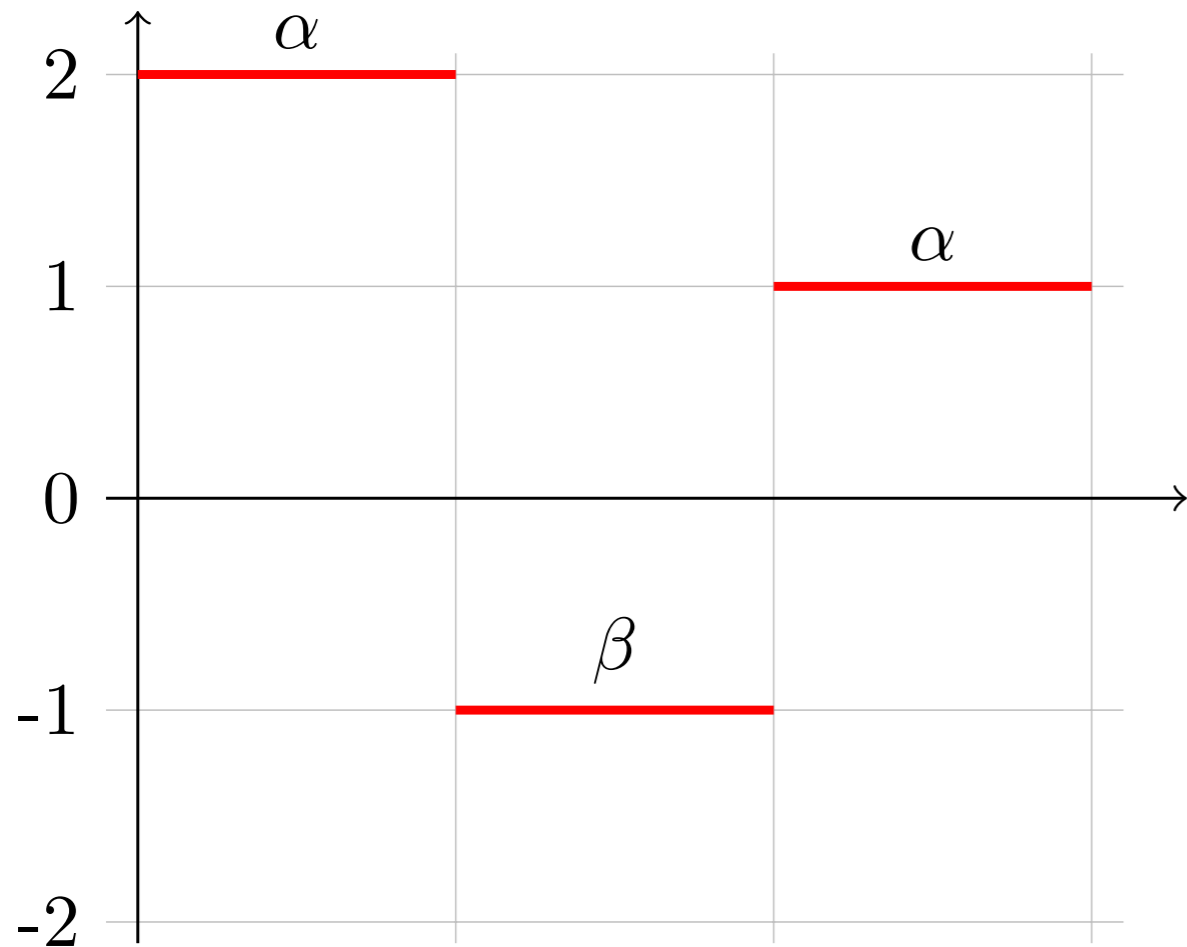


Simulated Tuning Fork

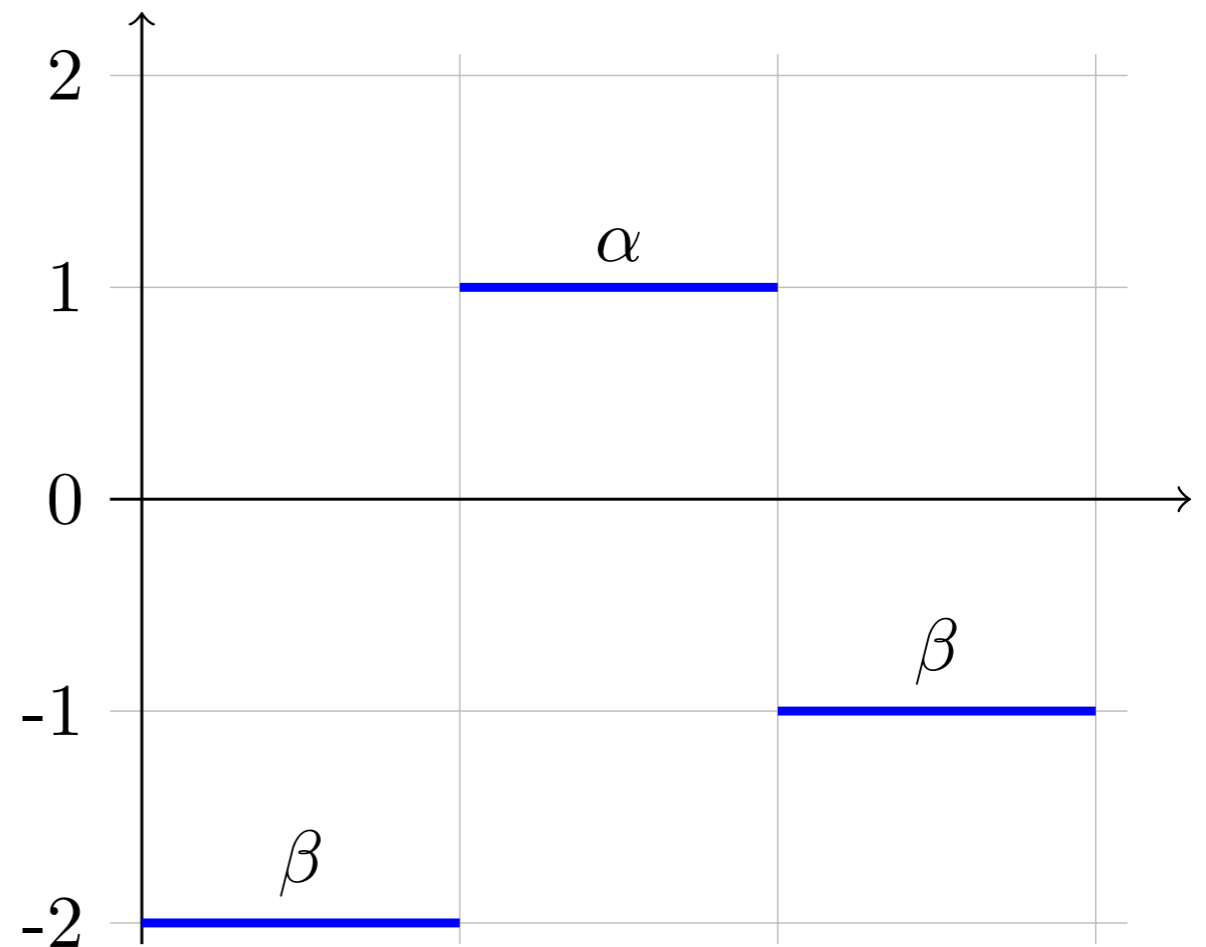


Opus I: Duet for Pure Tones

Pattern α

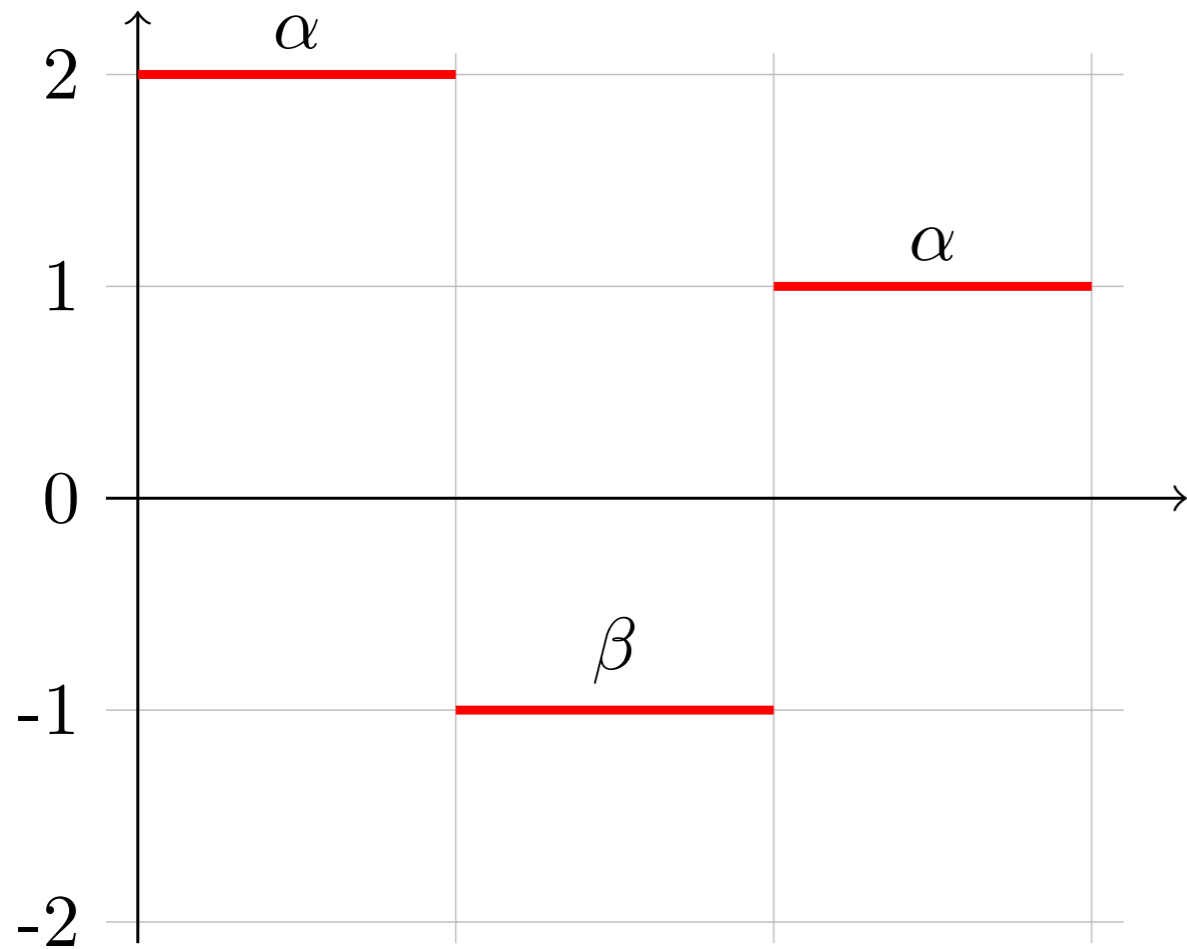


Pattern β

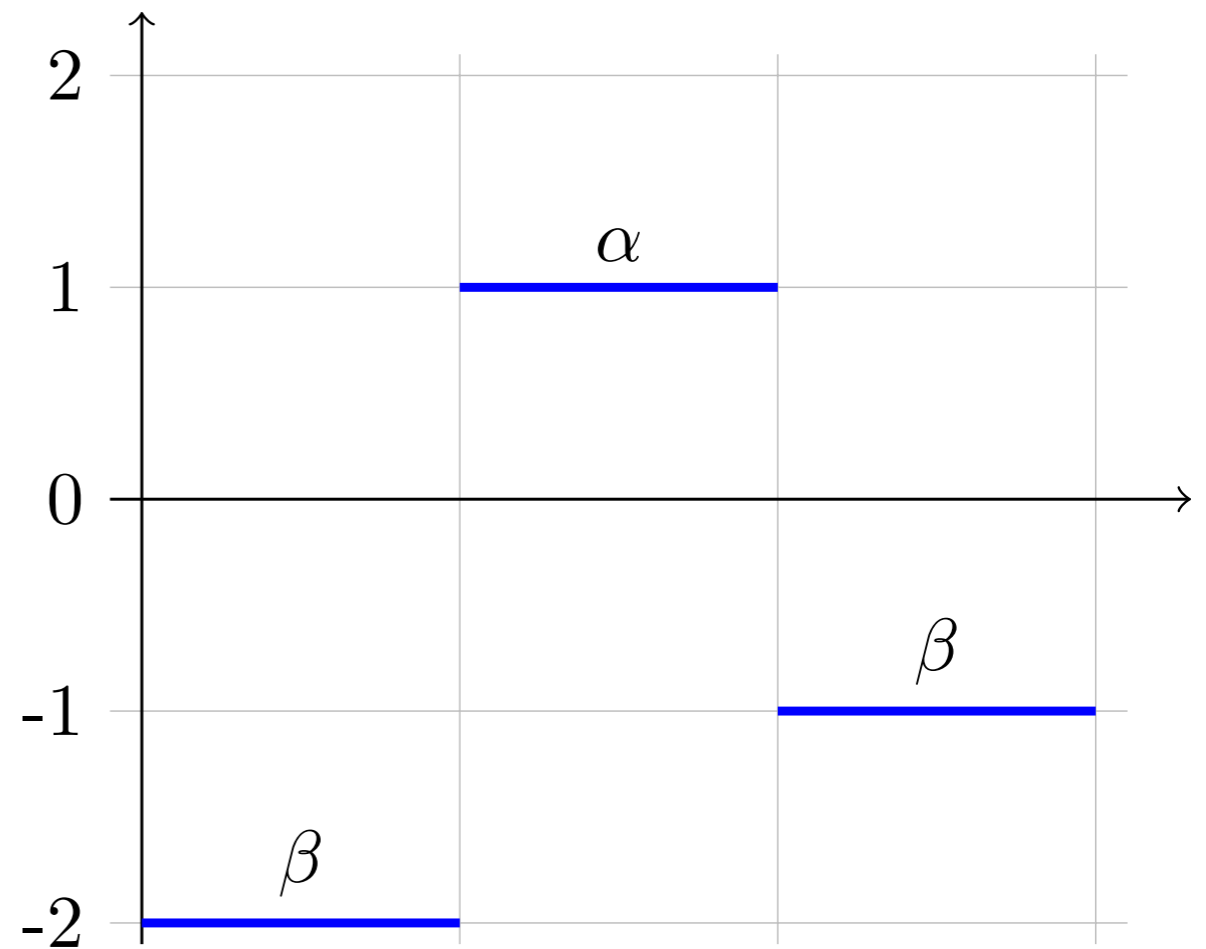


Opus I: Duet for Pure Tones

Pattern α



Pattern β



Not so pure tones...

Not so pure tones...



Timbre

Timbre

- ▶ Timbre is the intrinsic “sound quality” of a musical note or sound.

Timbre

- ▶ Timbre is the intrinsic “sound quality” of a musical note or sound.

- ▶ Name that timbre!

Timbre

- ▶ Timbre is the intrinsic “sound quality” of a musical note or sound.

- ▶ Name that timbre!

Timbre

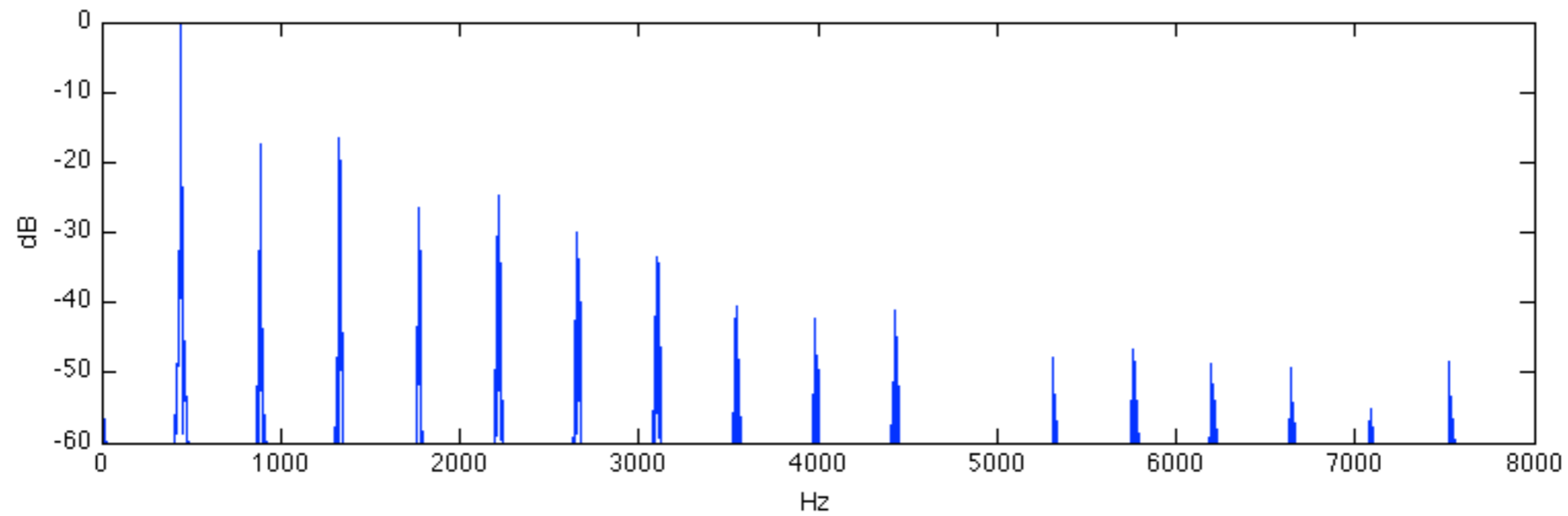
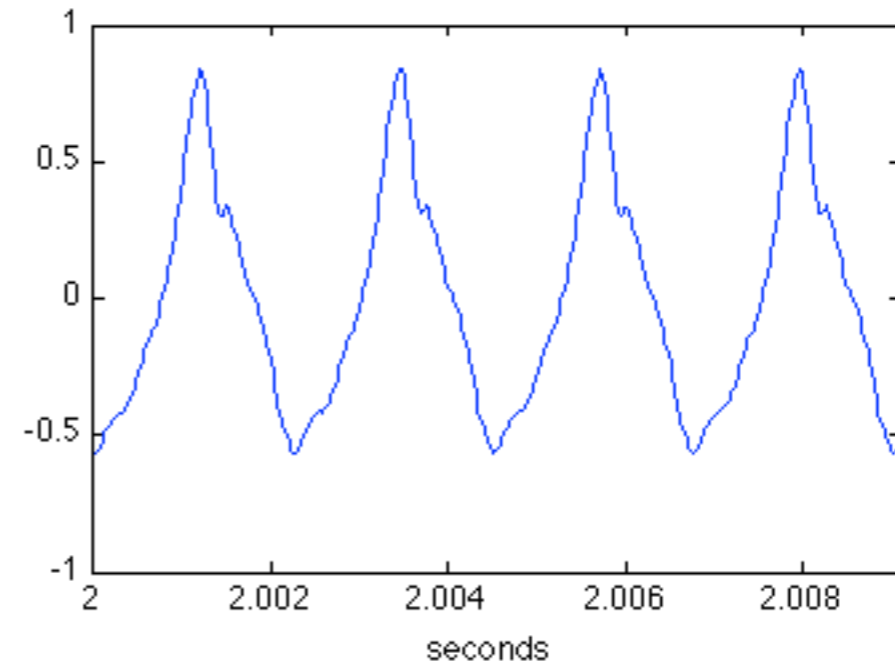
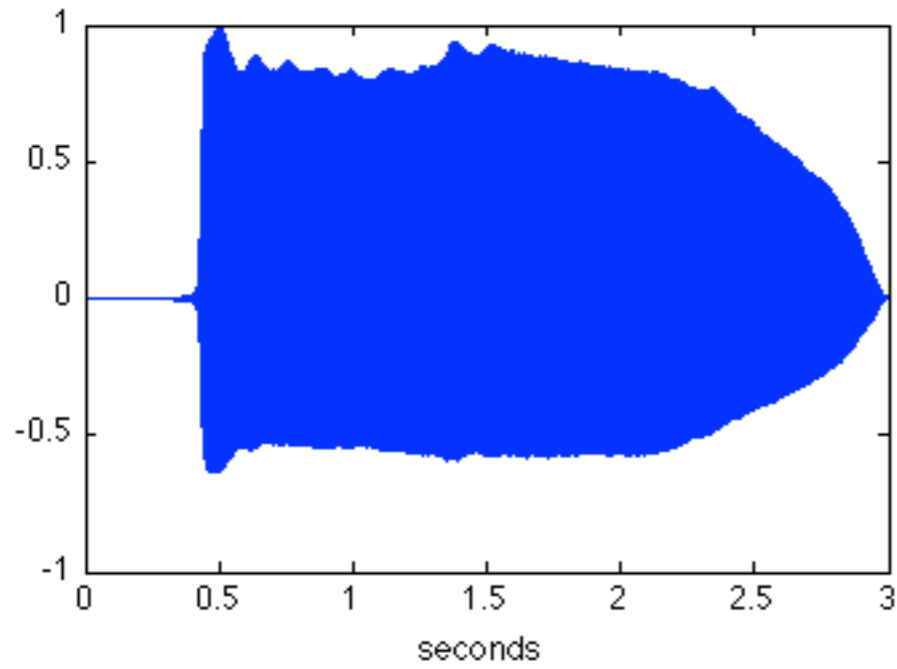
- ▶ Timbre is the intrinsic “sound quality” of a musical note or sound.

- ▶ Name that timbre!

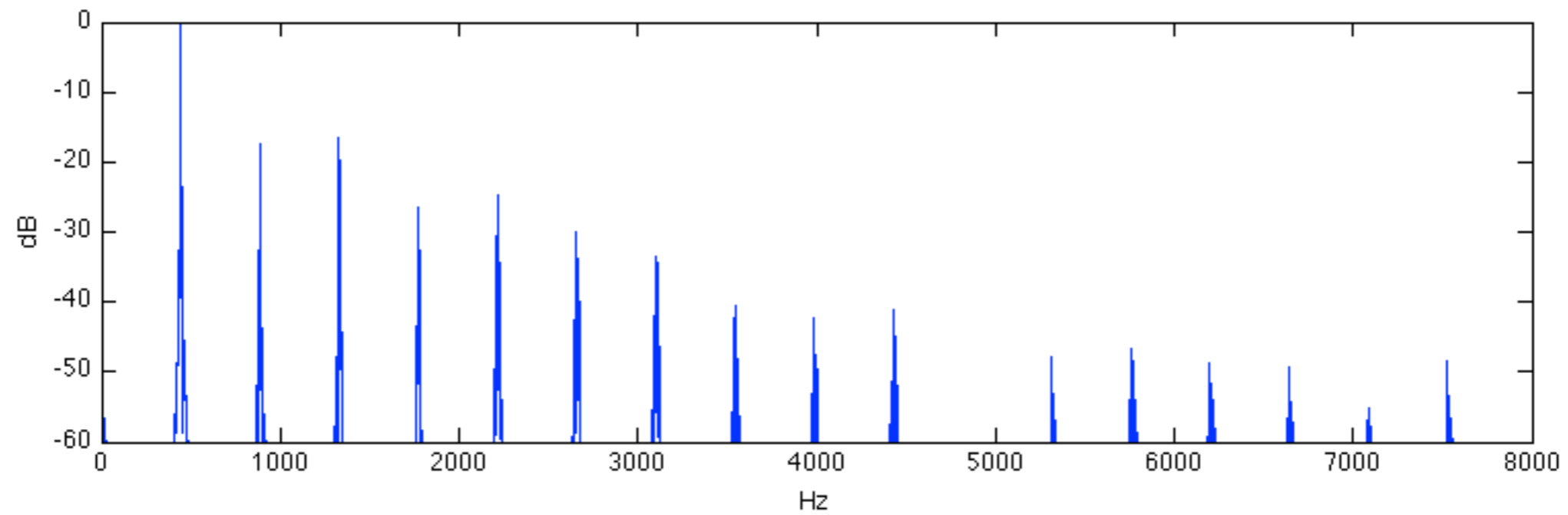
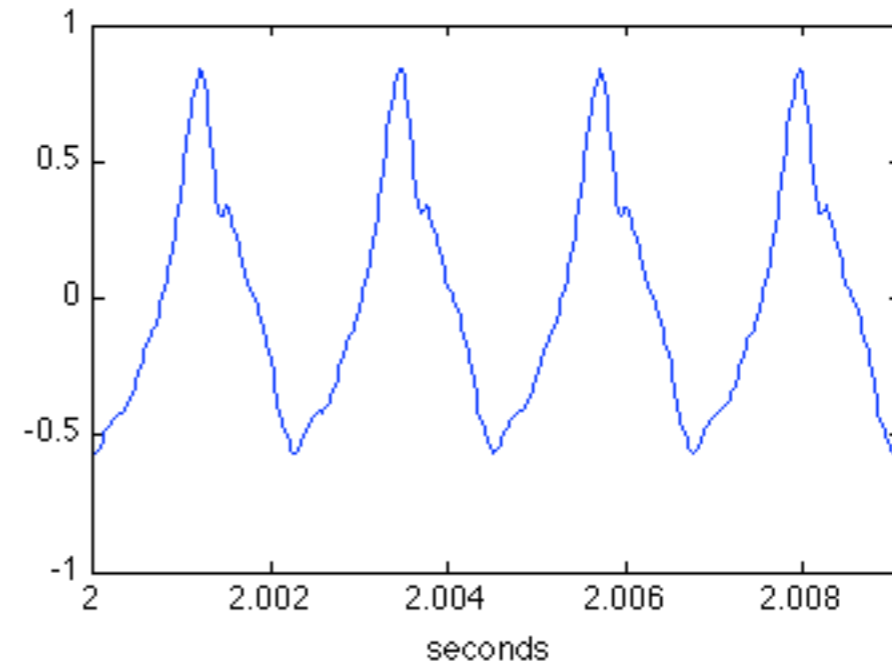
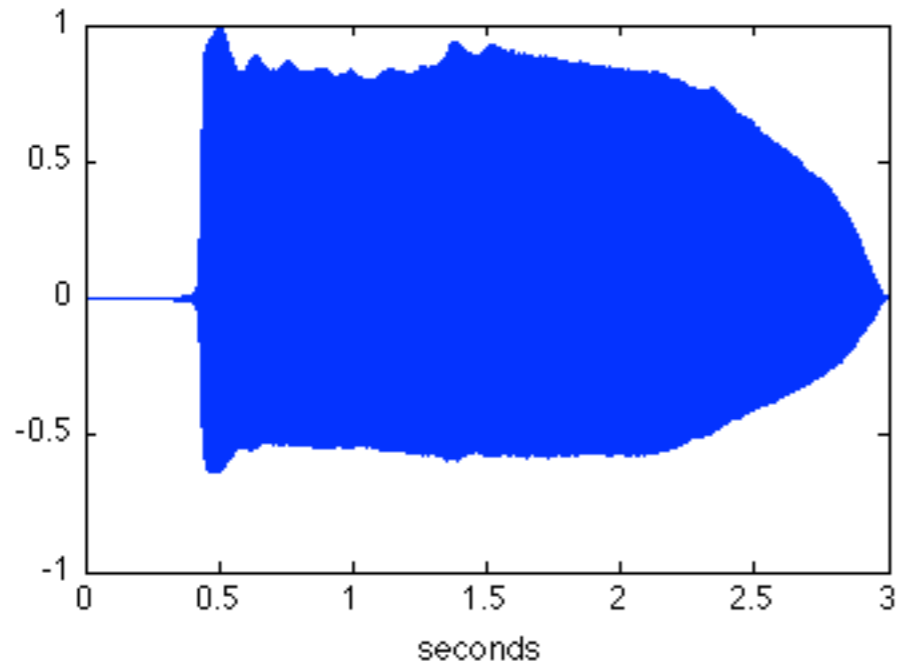
Timbre

- ▶ Timbre is the intrinsic “sound quality” of a musical note or sound.
- ▶ Name that timbre!
- ▶ What determines an instrument’s characteristic timbre?

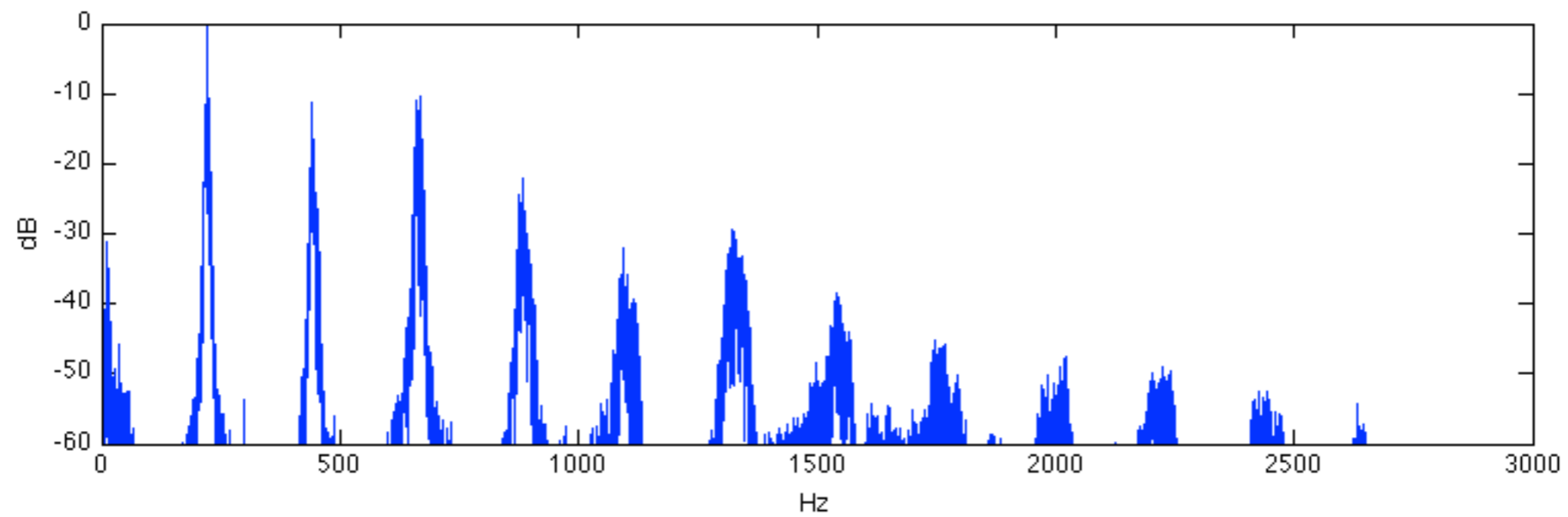
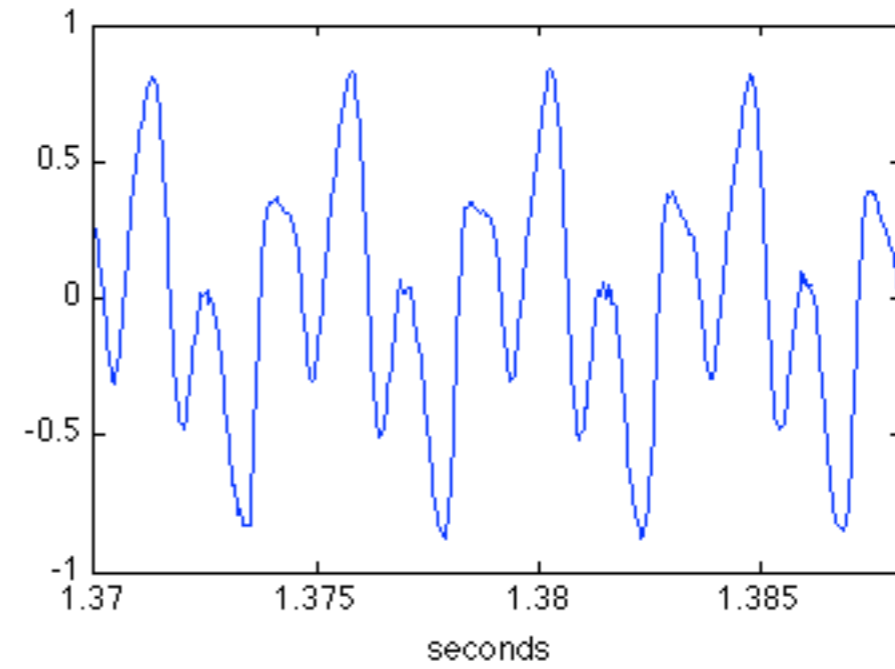
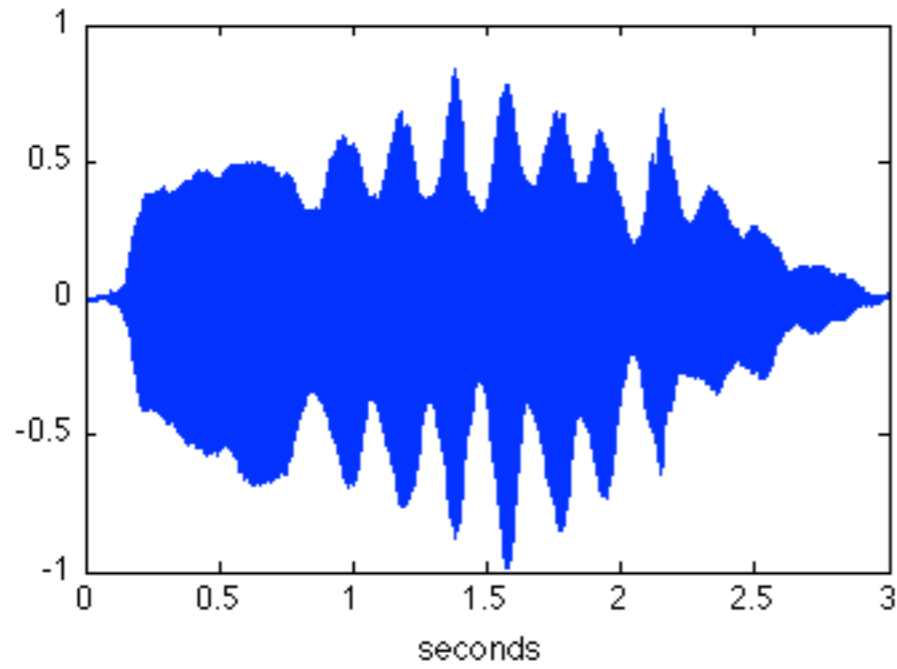
Alto Saxophone (A4)



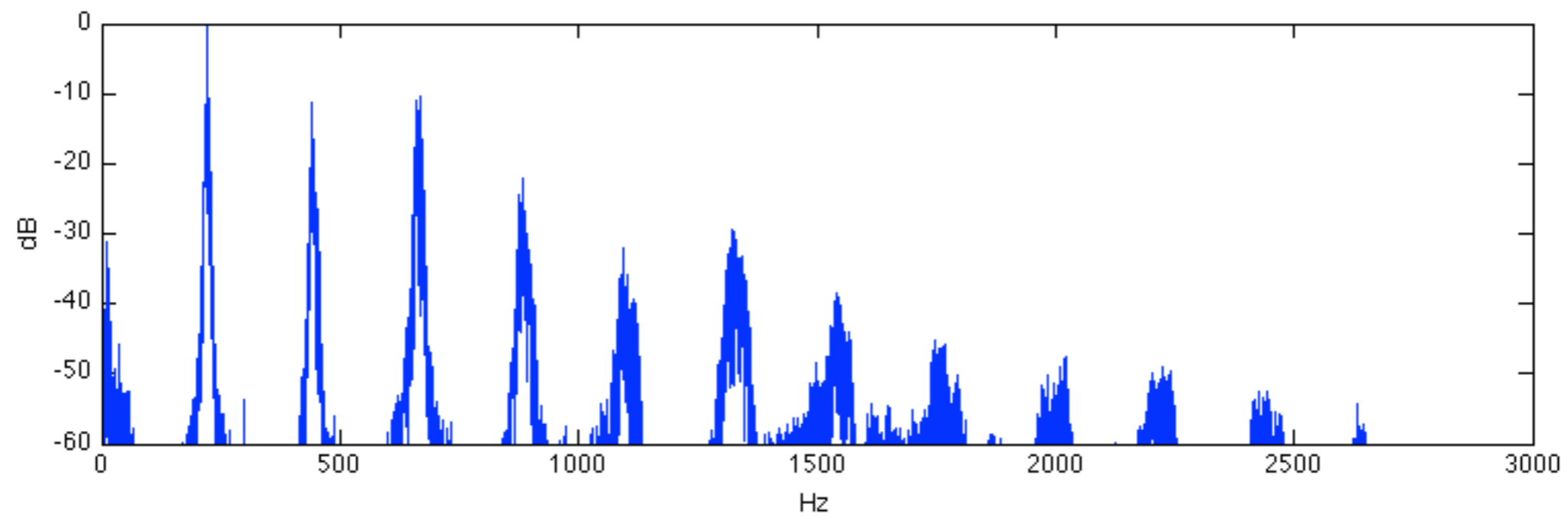
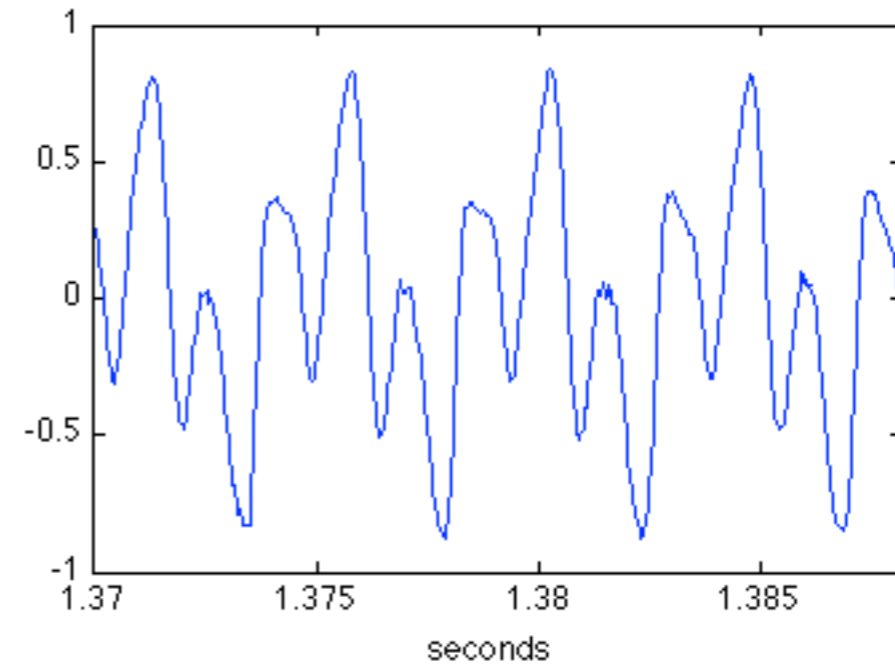
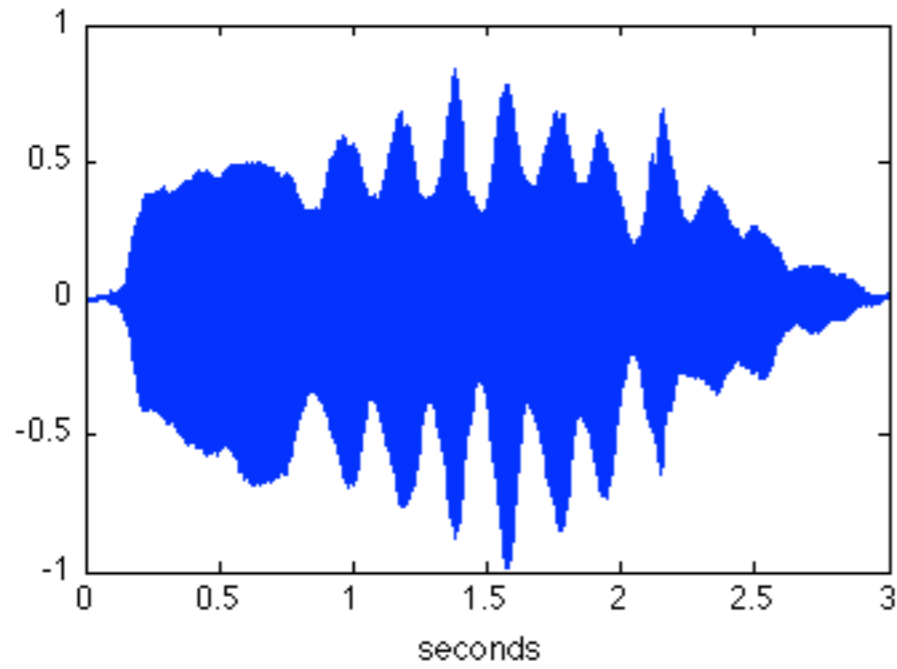
Alto Saxophone (A4)



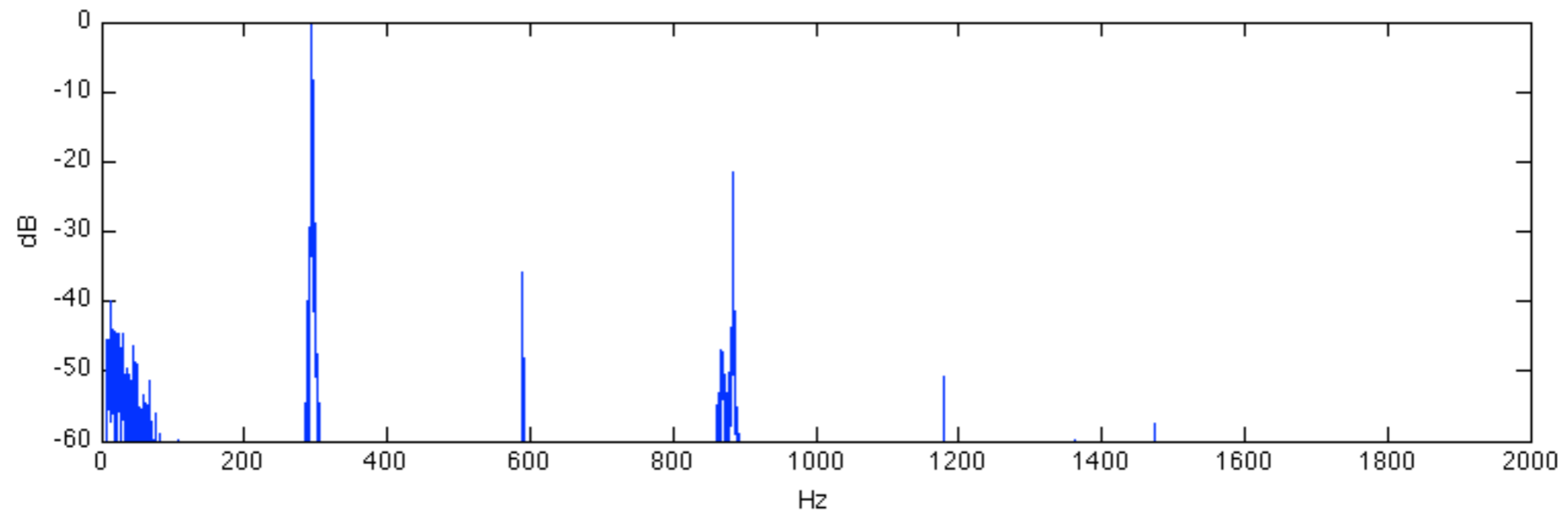
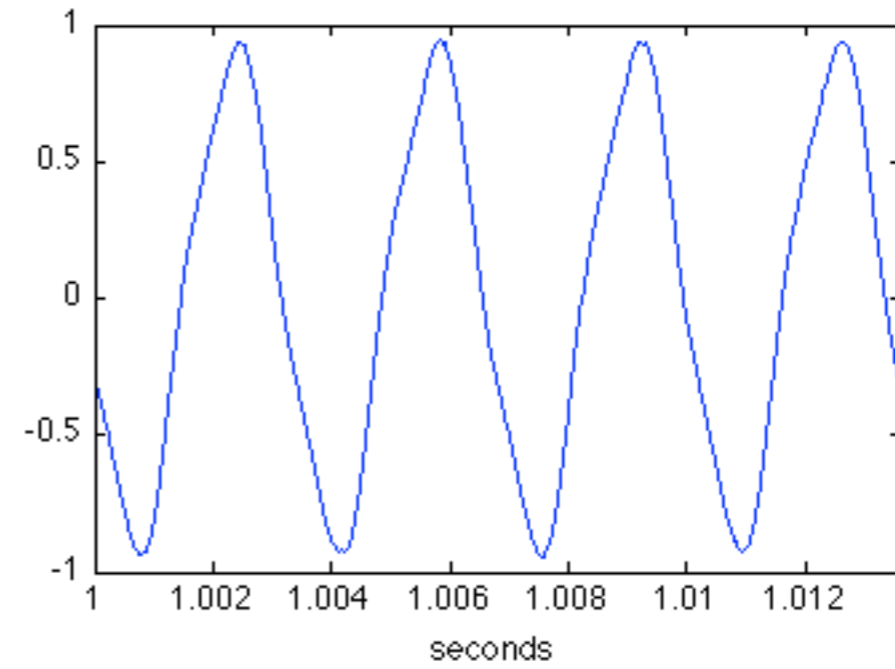
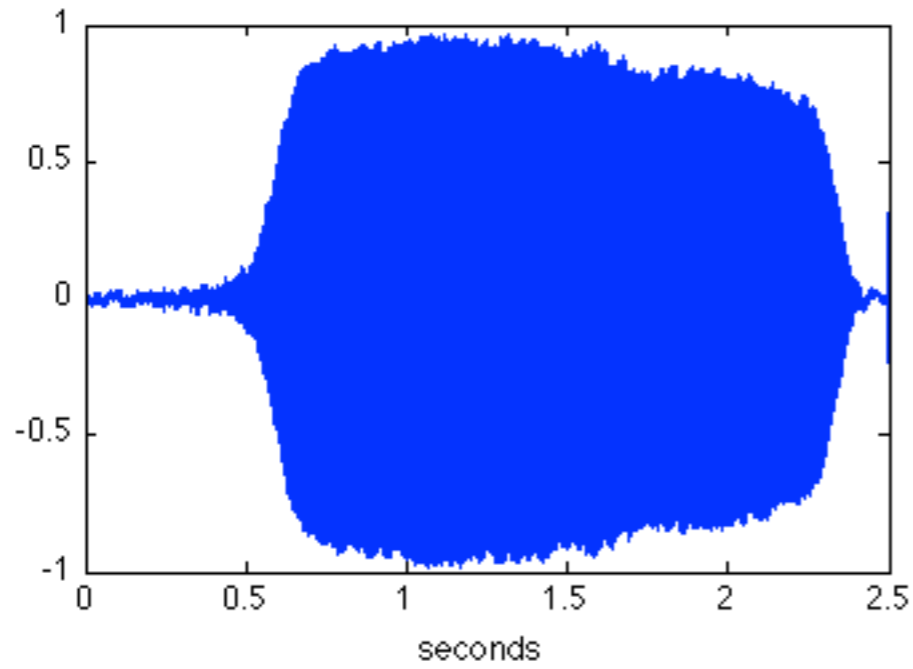
Bass Flute (A3)



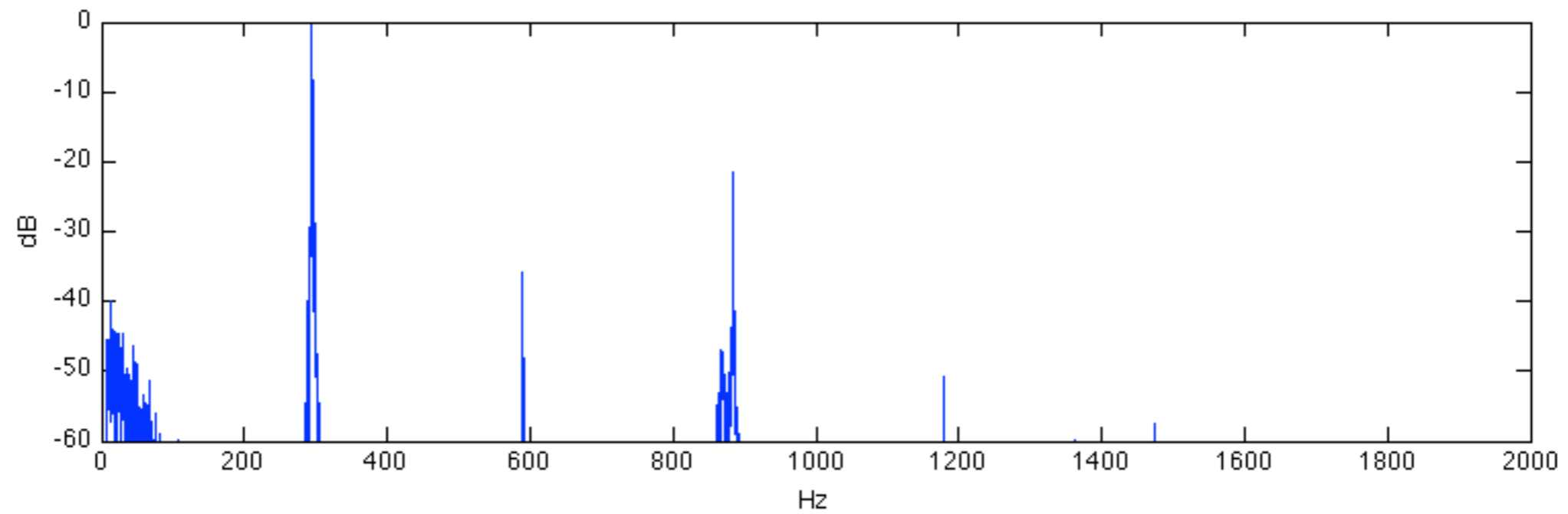
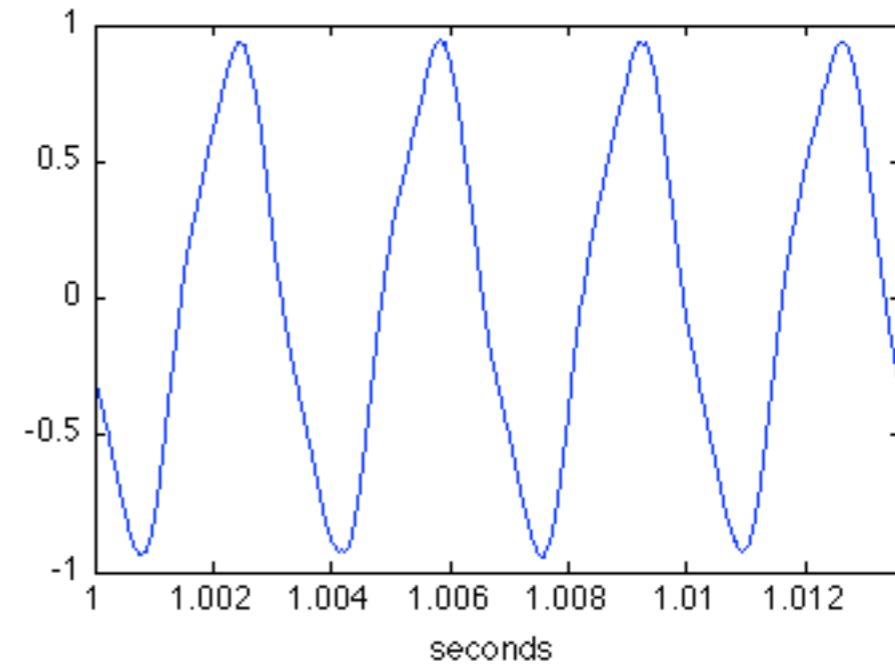
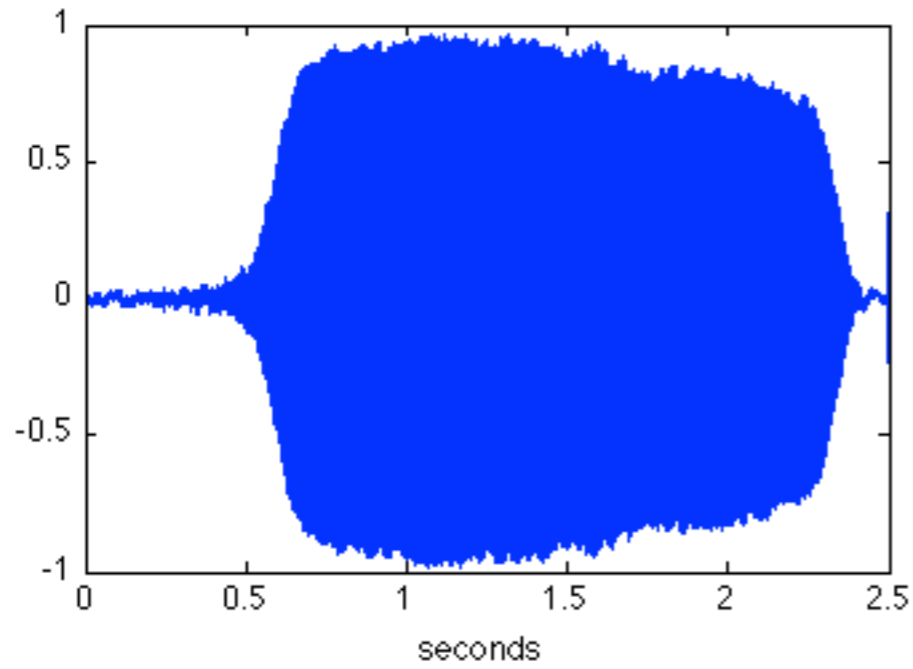
Bass Flute (A3)



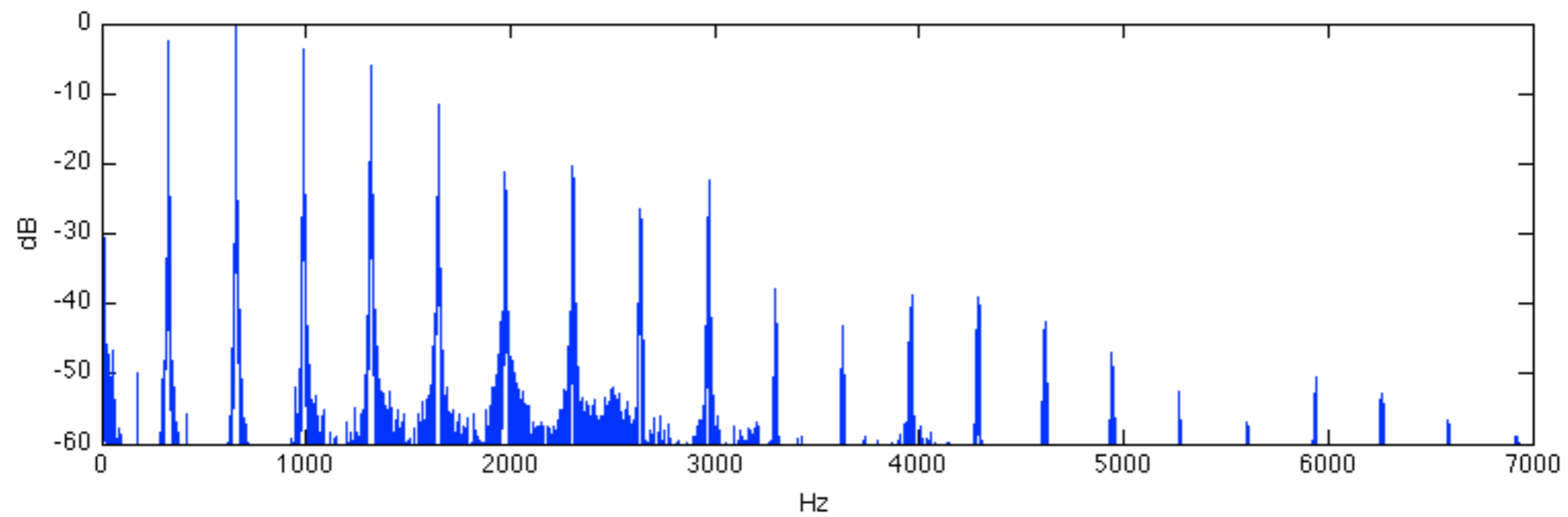
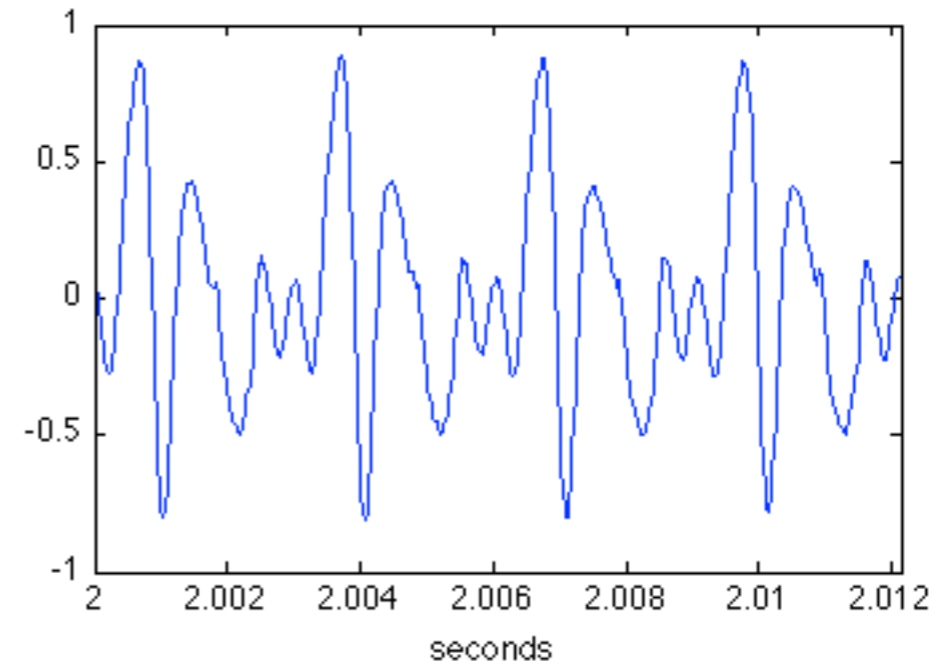
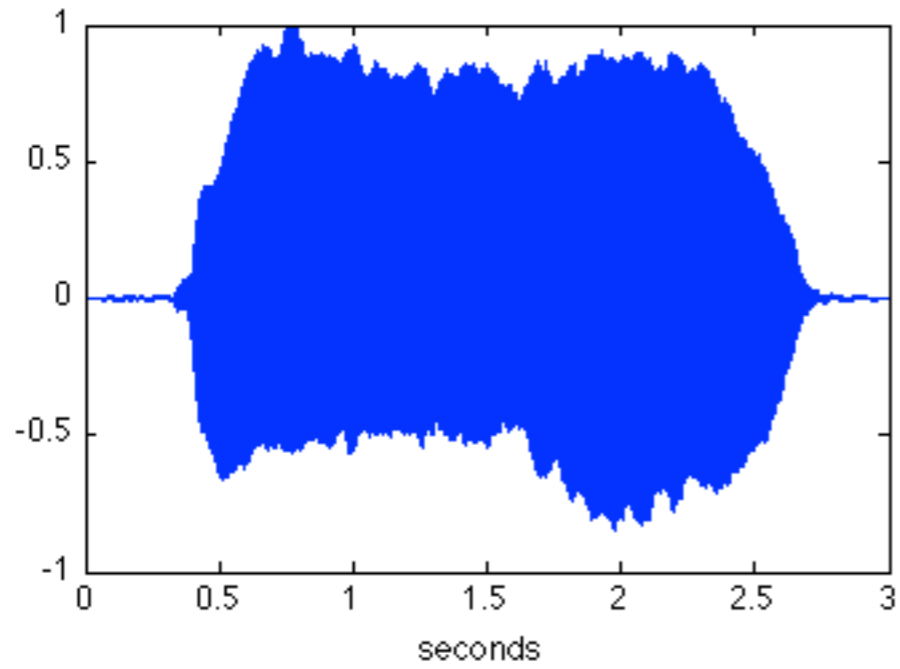
Clarinet (D4)



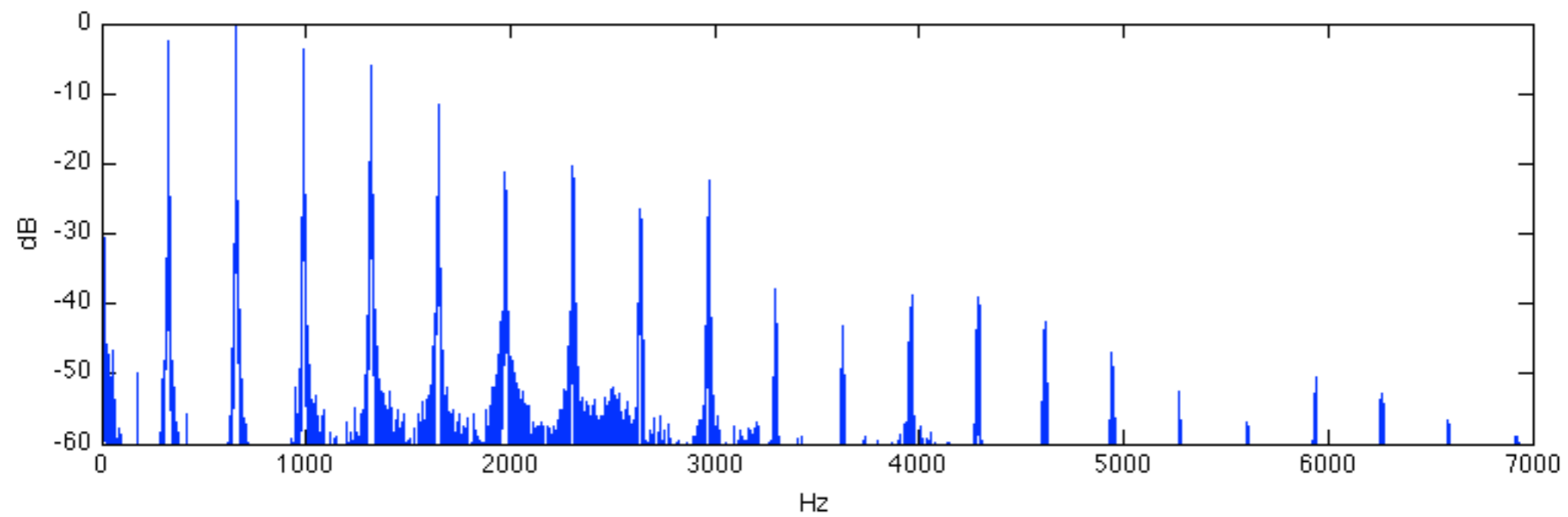
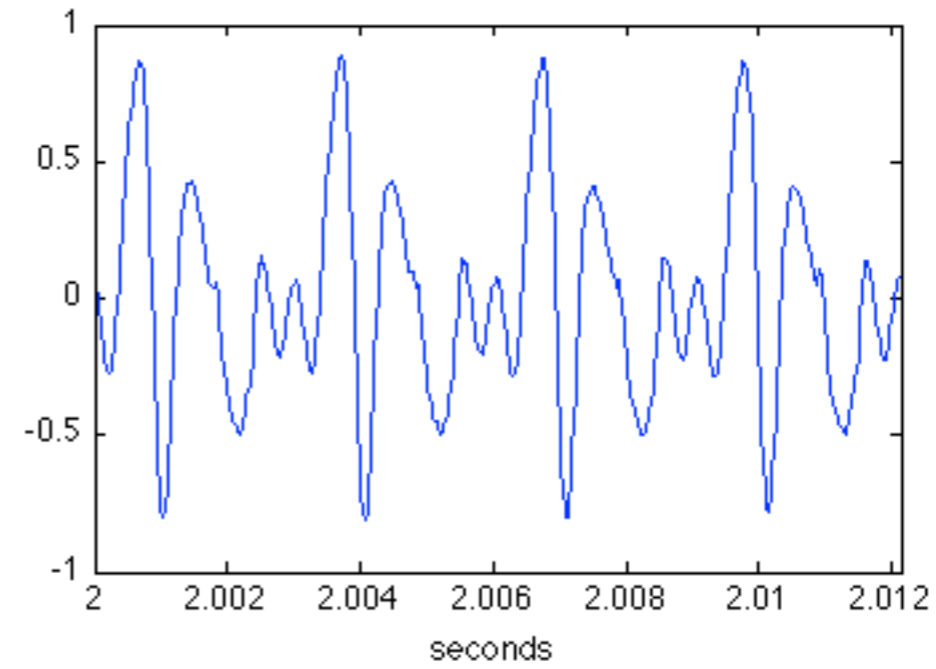
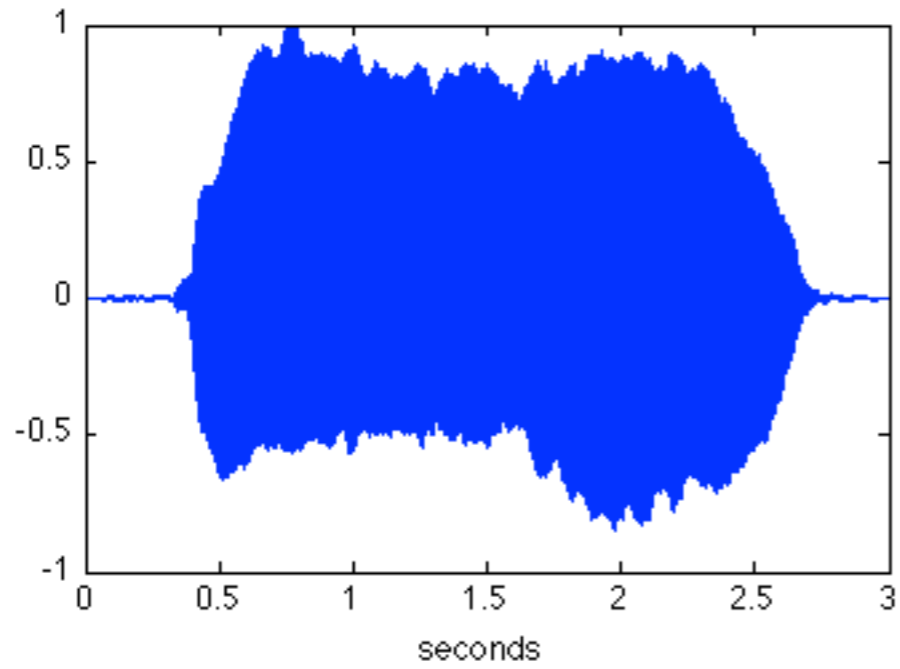
Clarinet (D4)



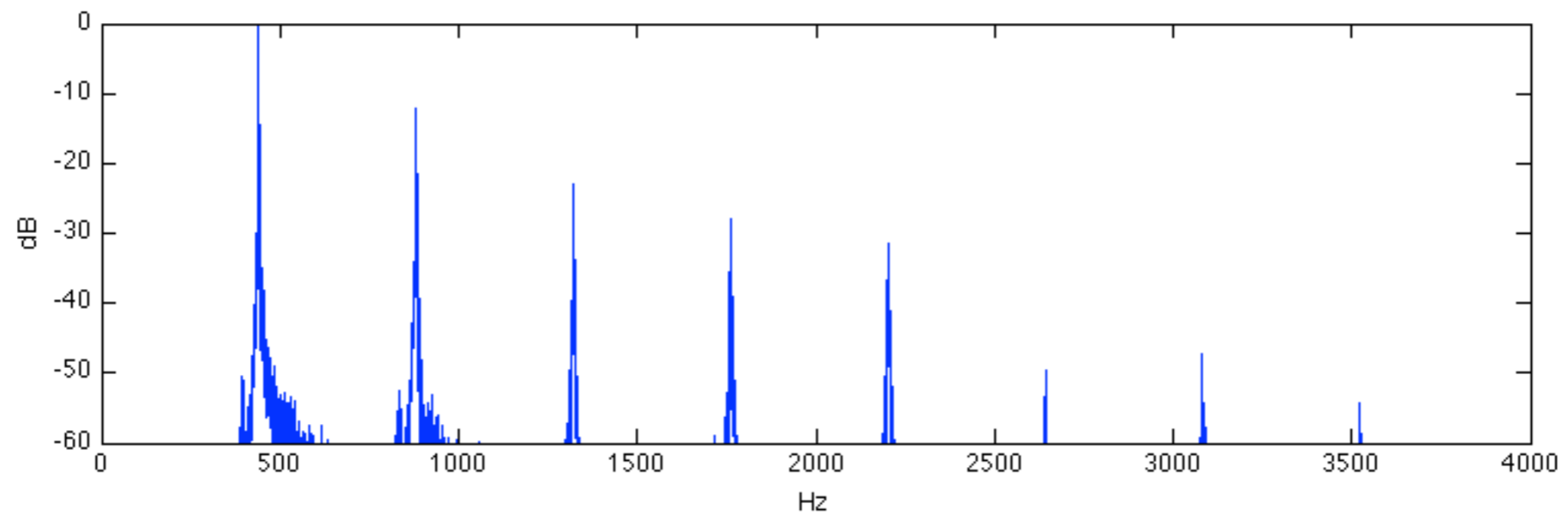
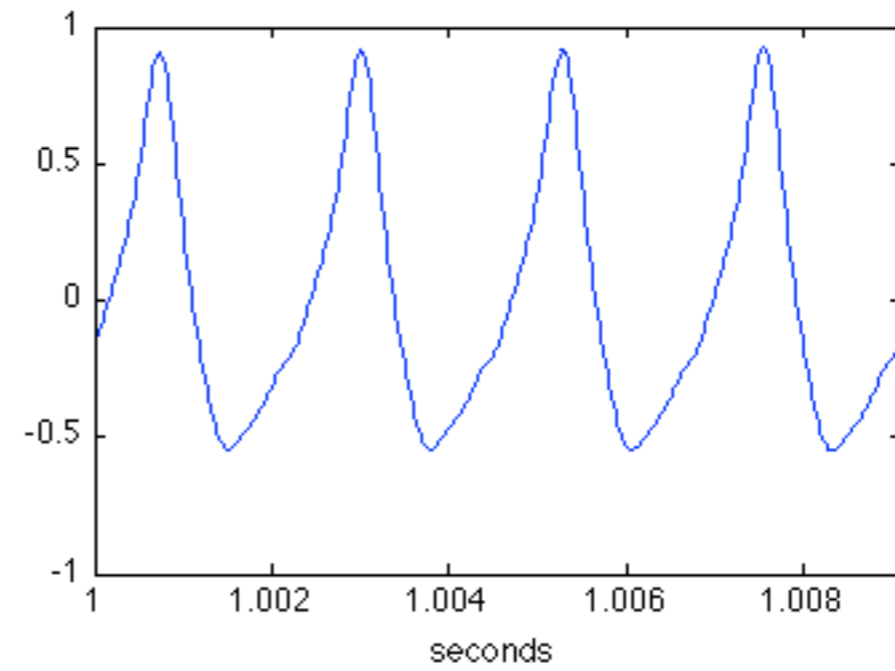
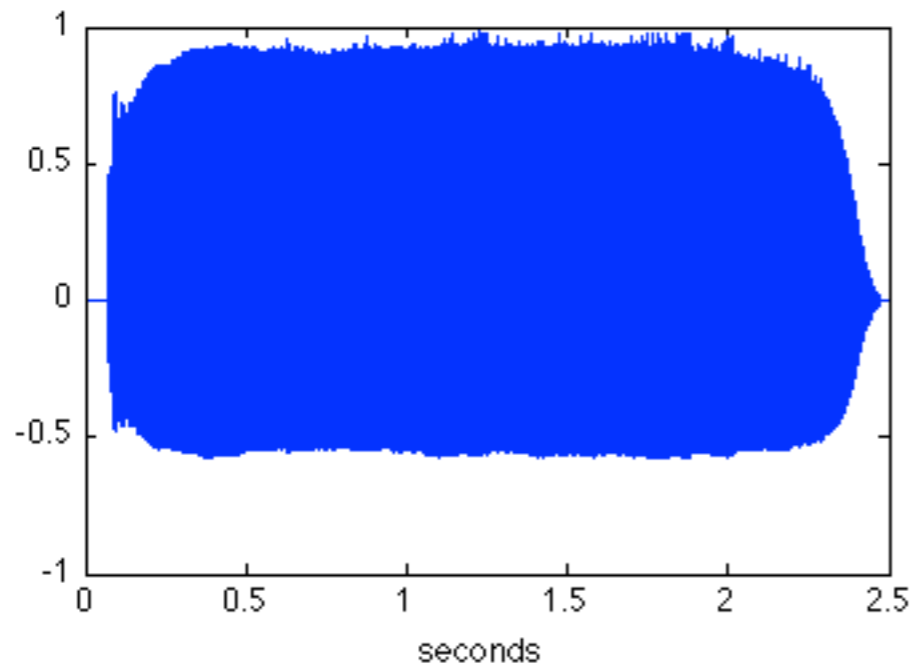
Flute (E4)



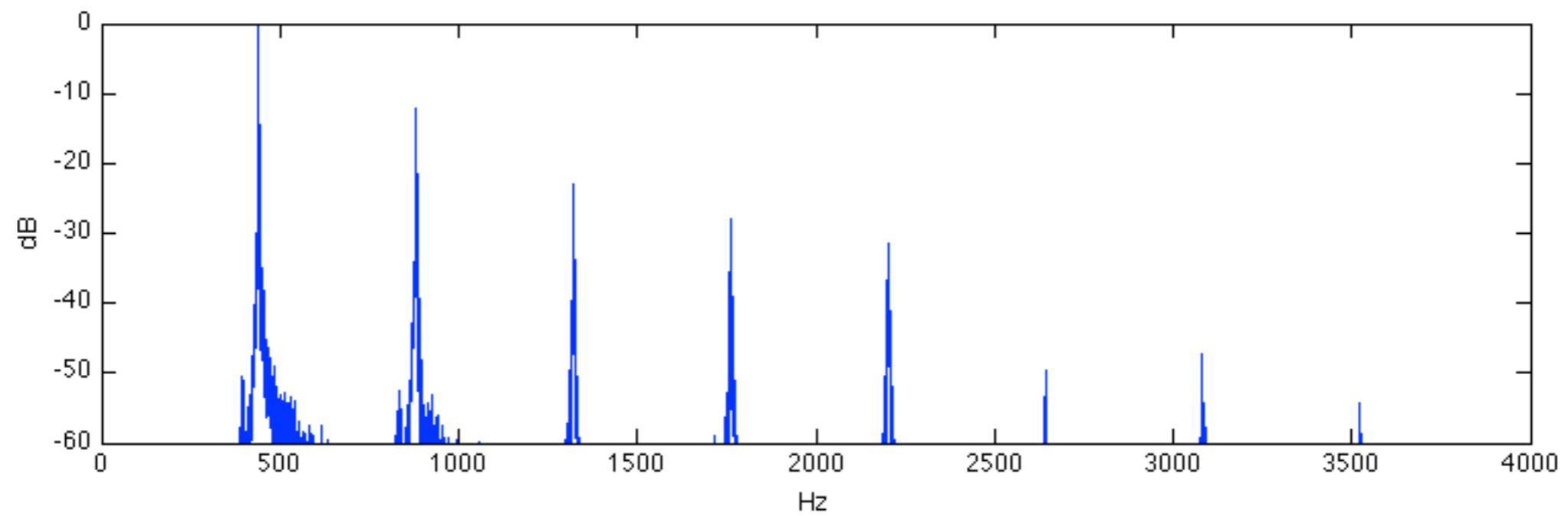
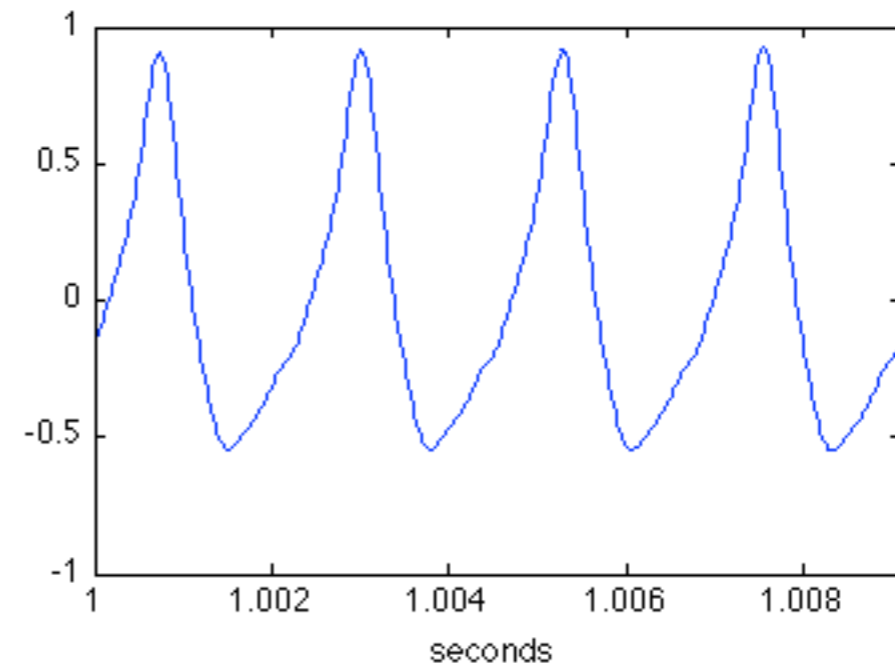
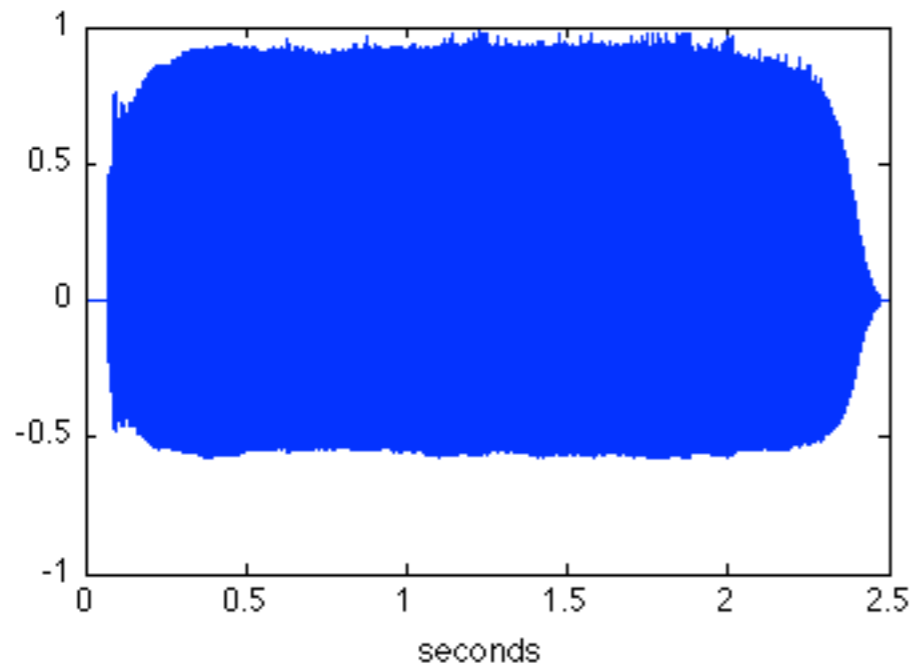
Flute (E4)



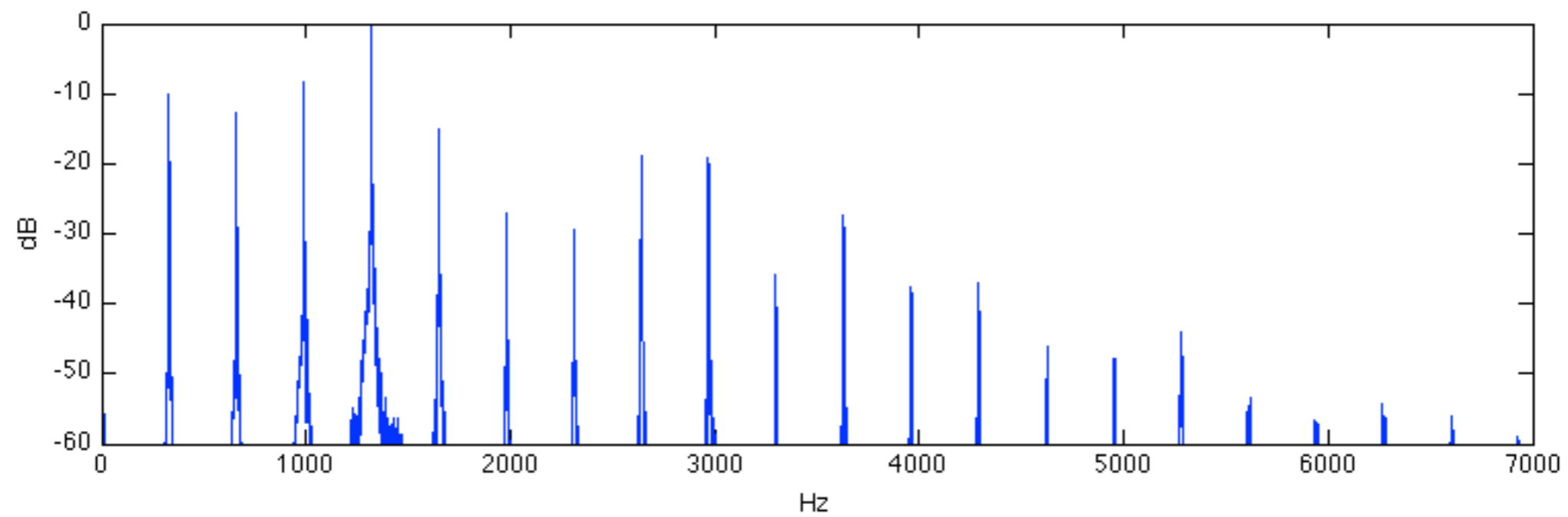
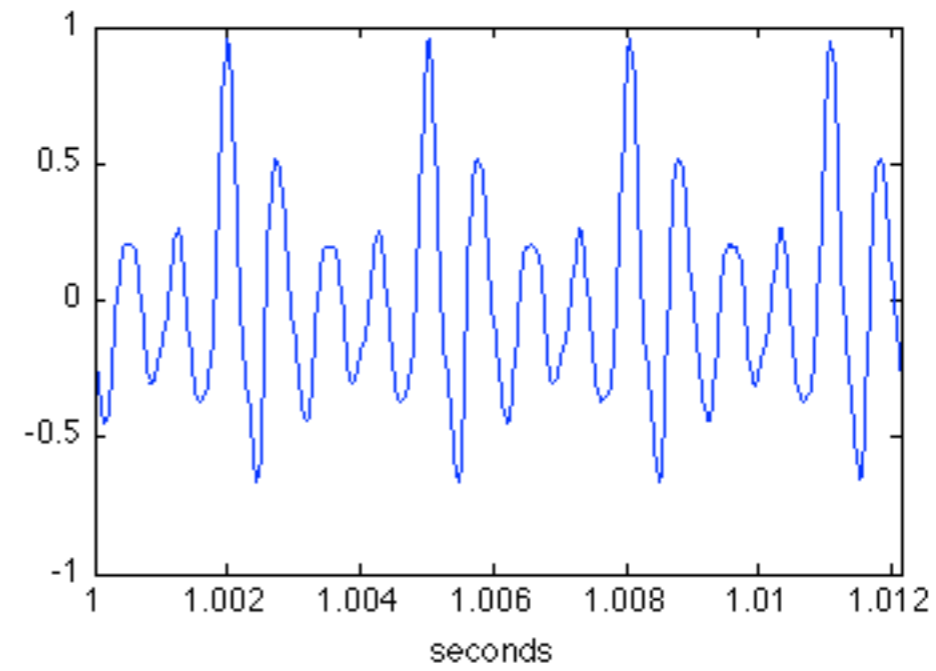
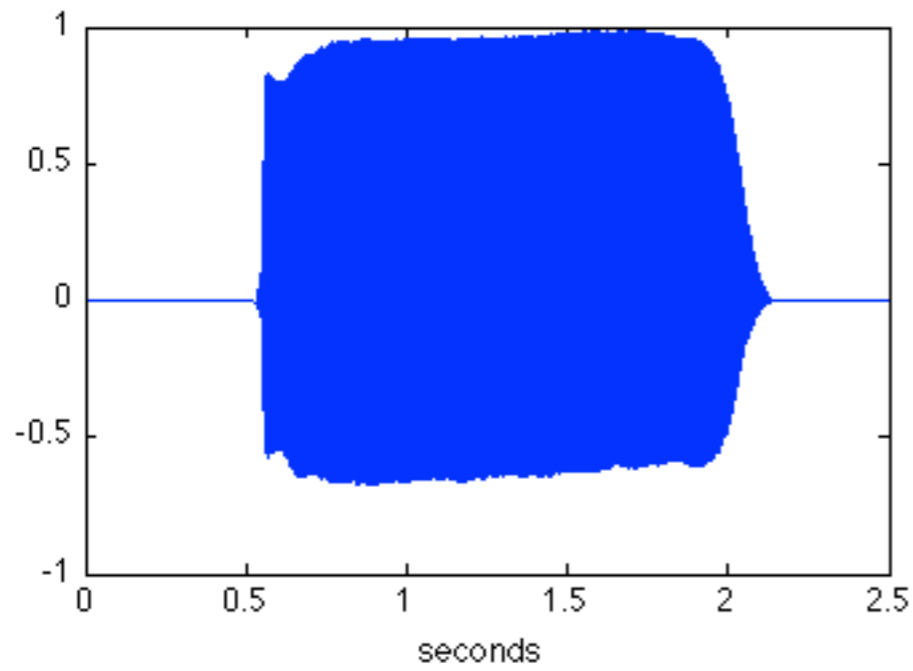
Horn (A4)



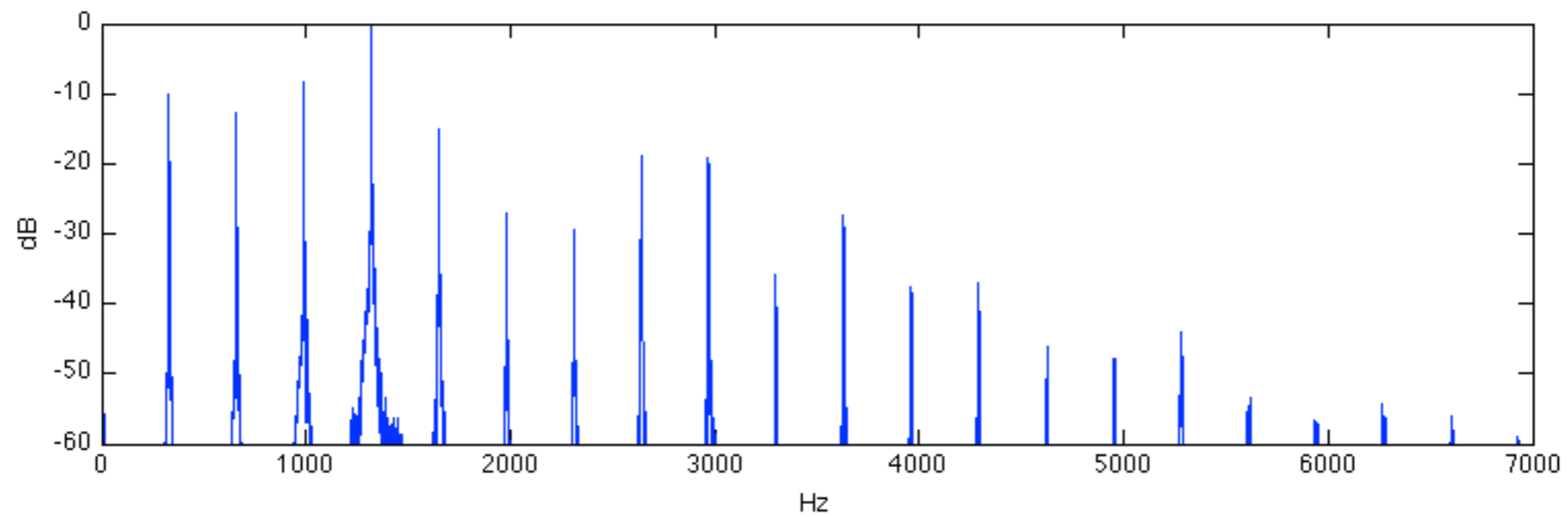
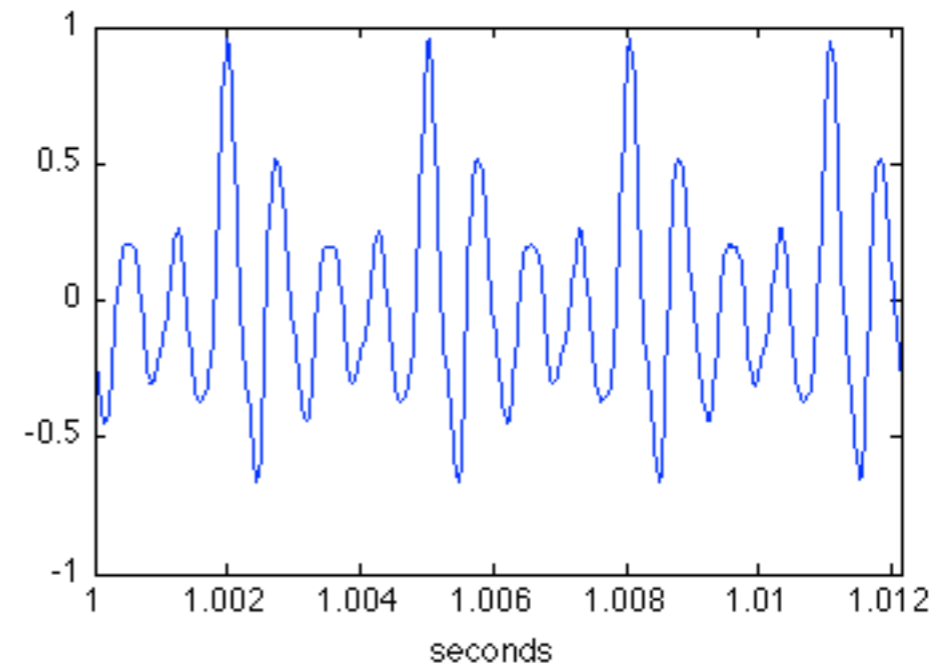
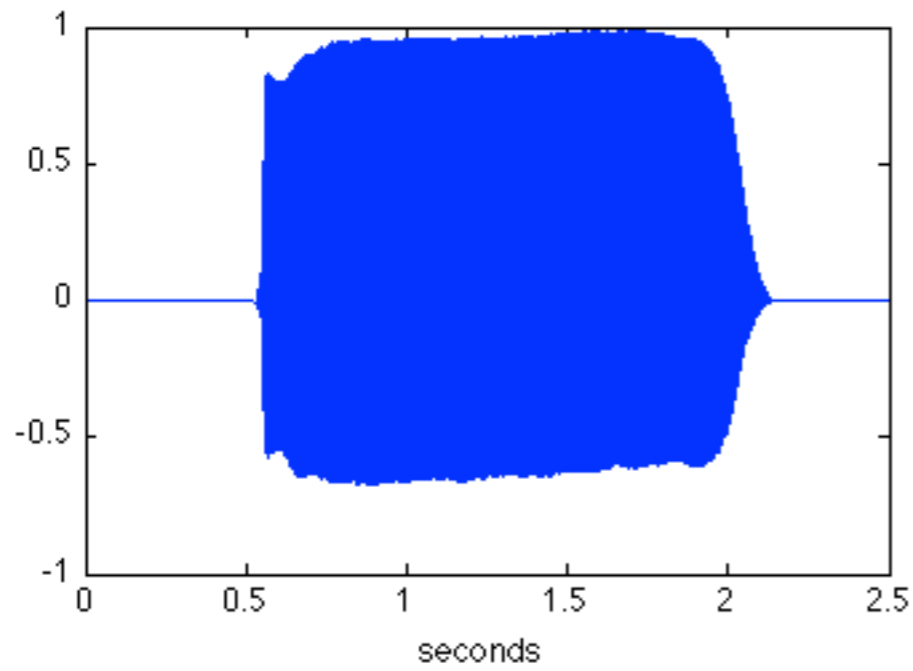
Horn (A4)



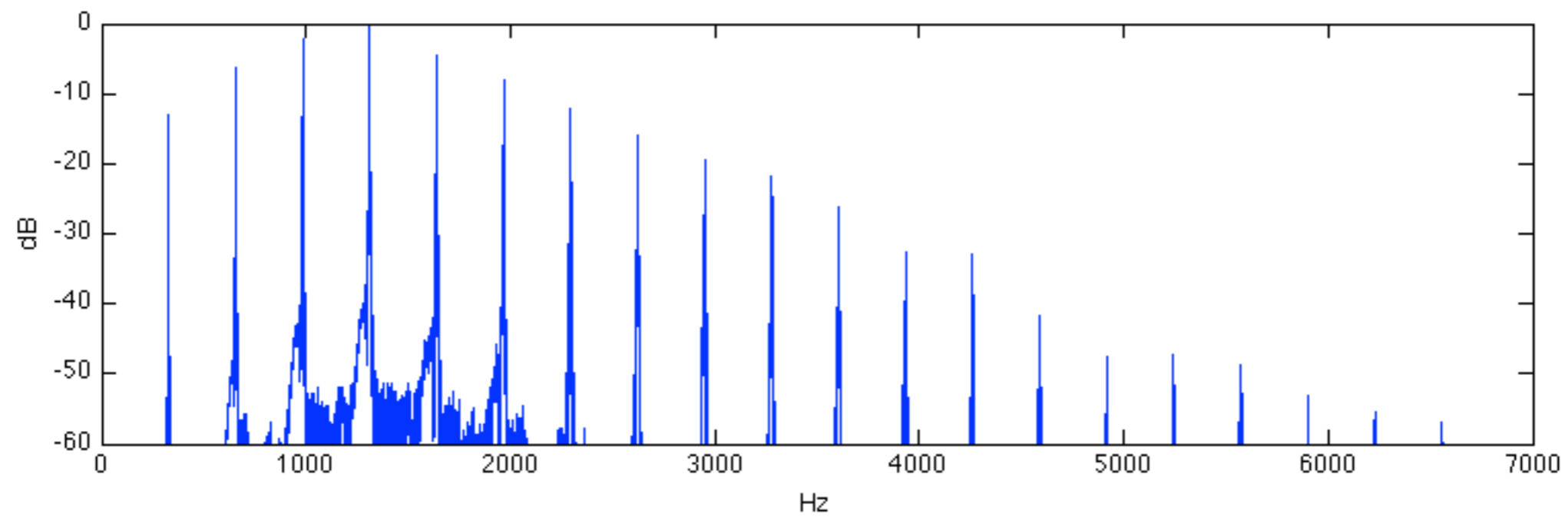
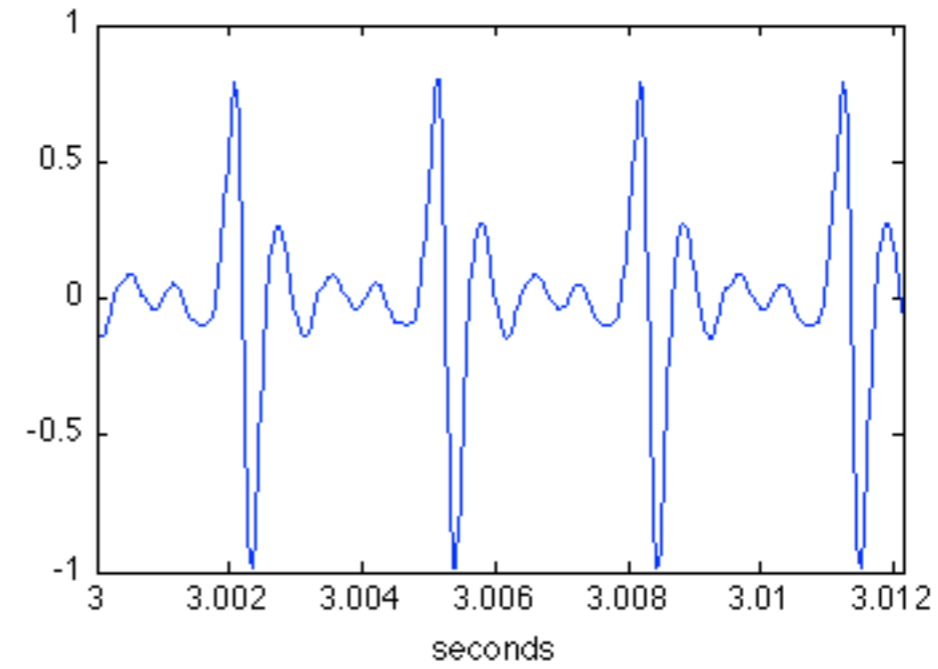
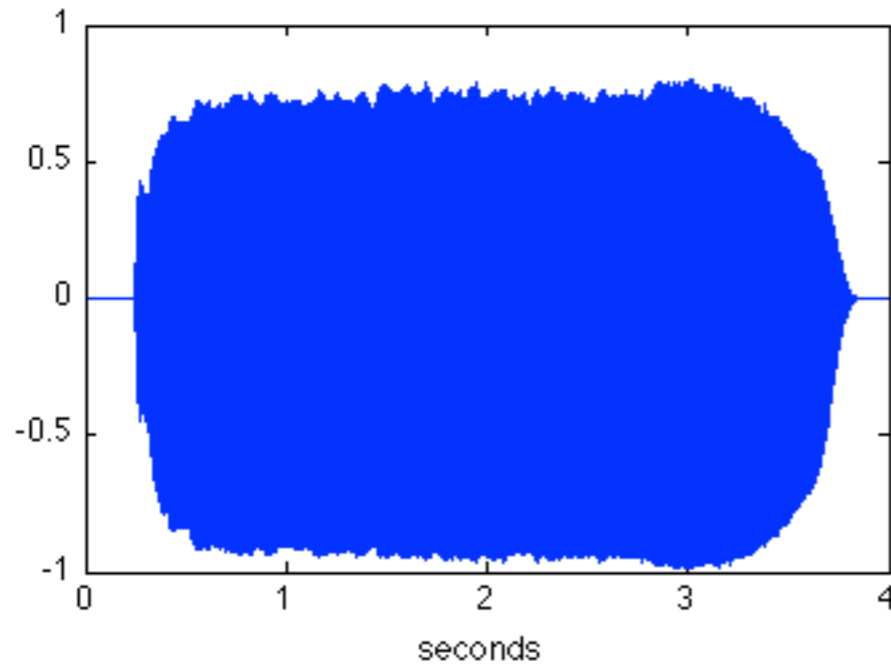
Oboe (E4)



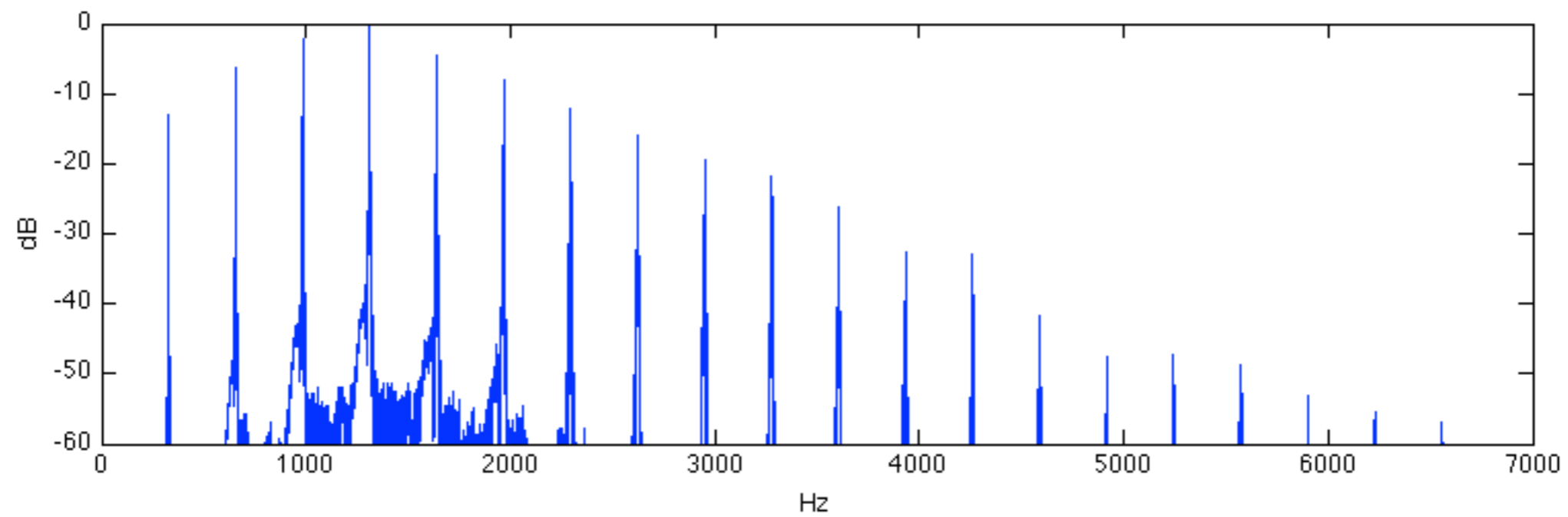
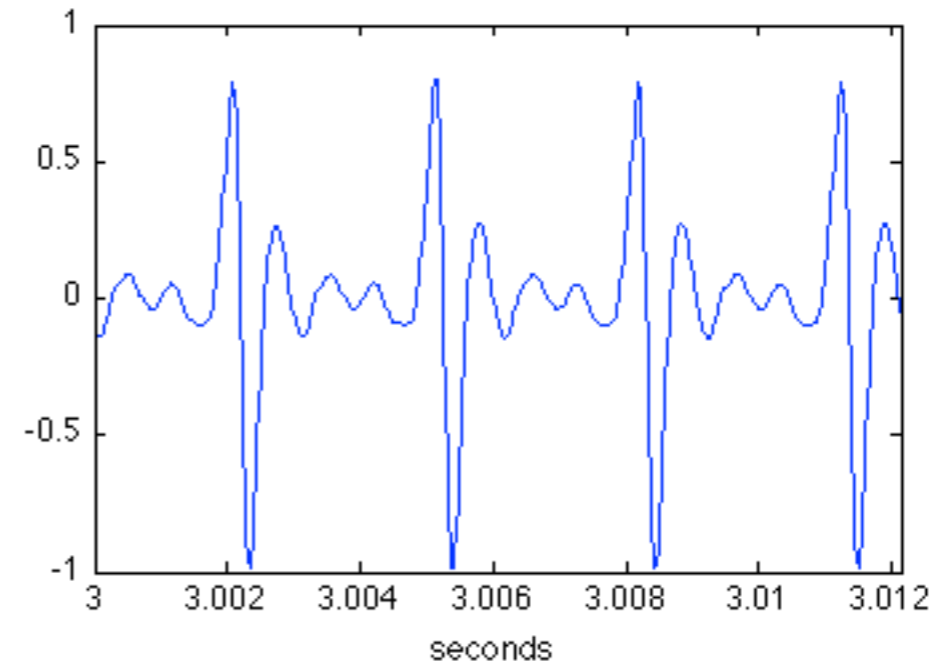
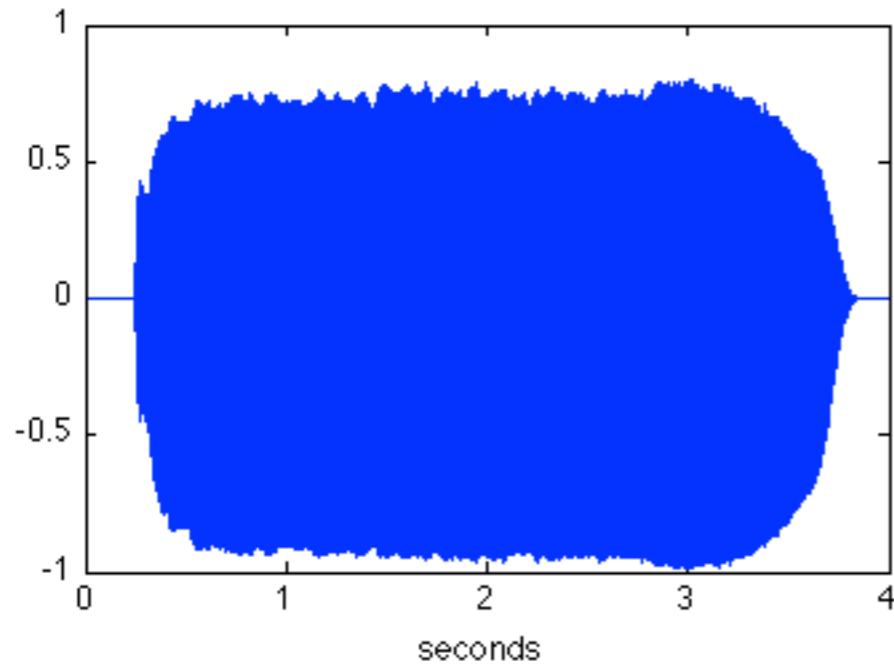
Oboe (E4)



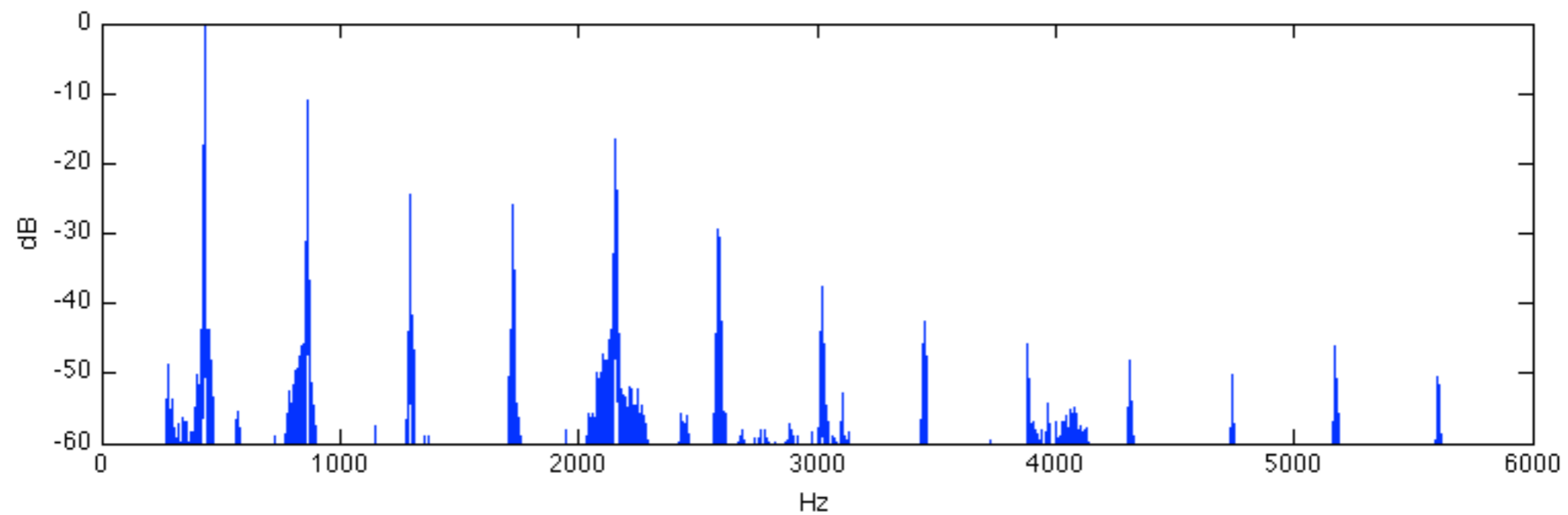
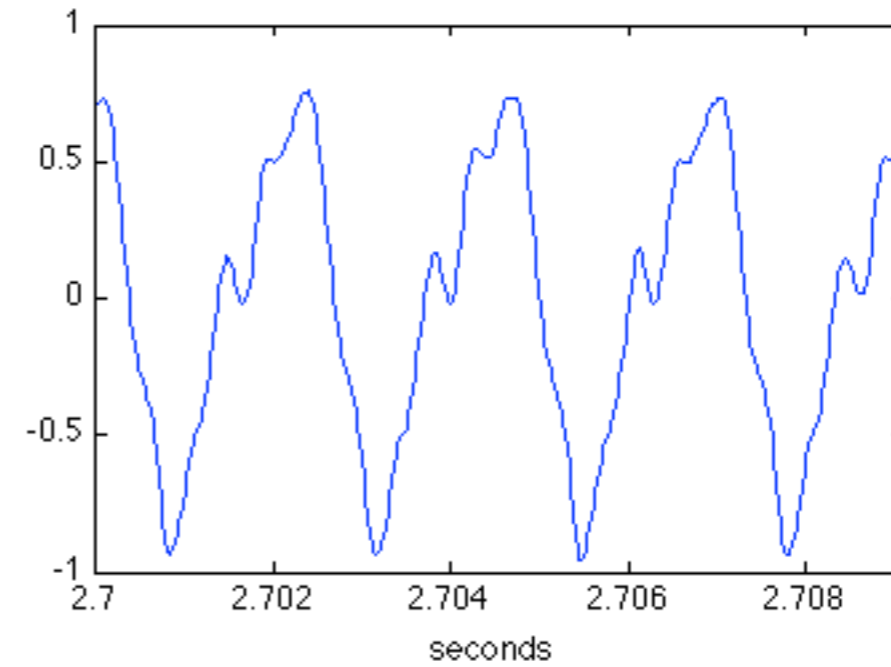
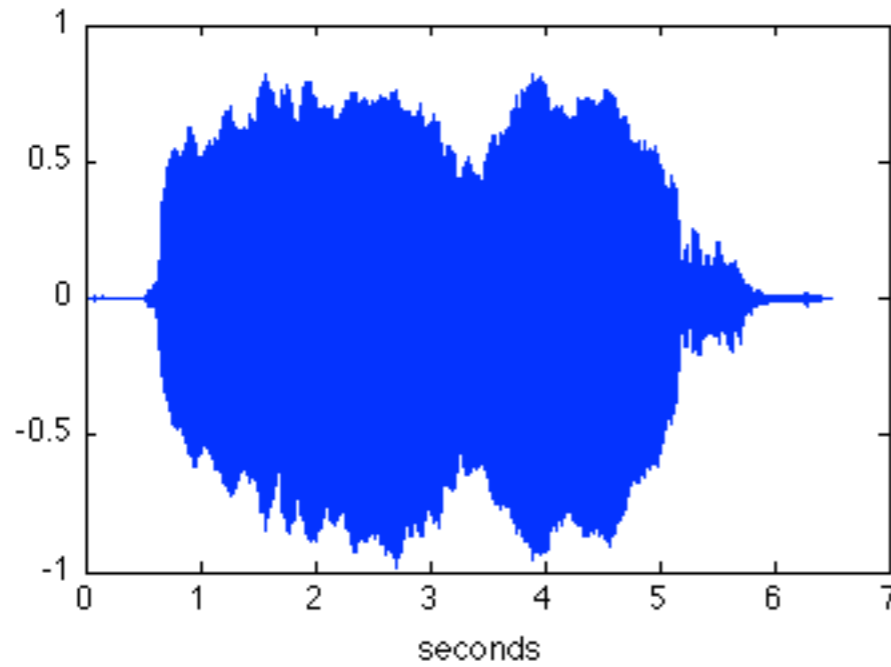
Trumpet (E4)



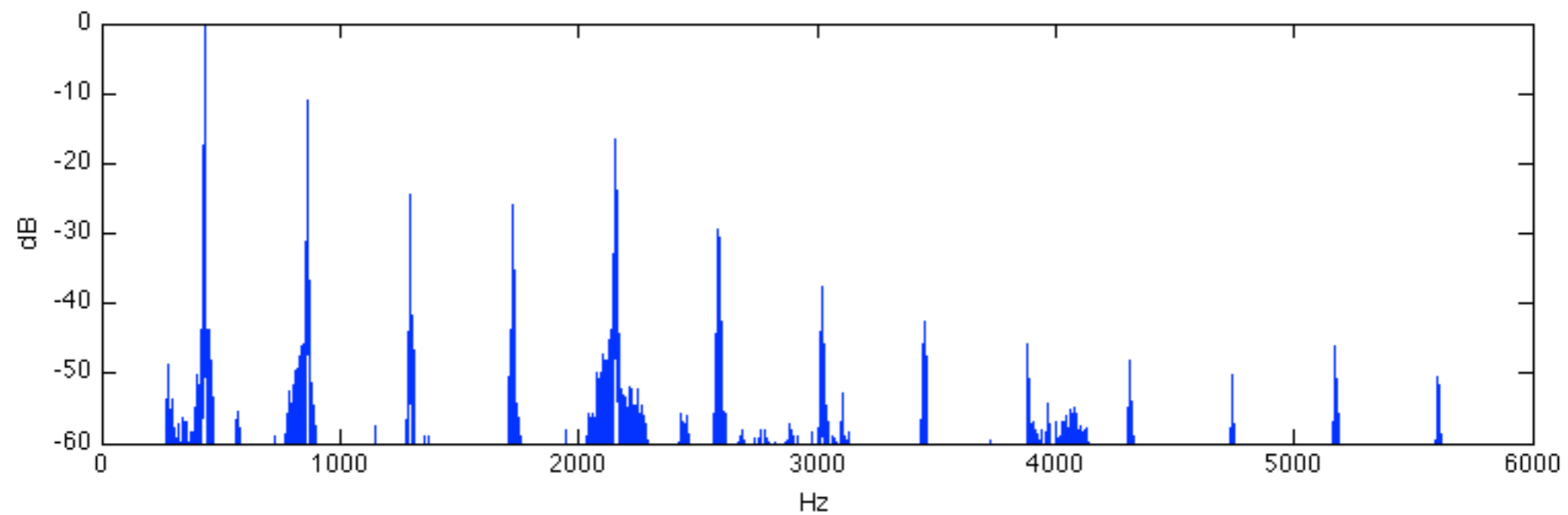
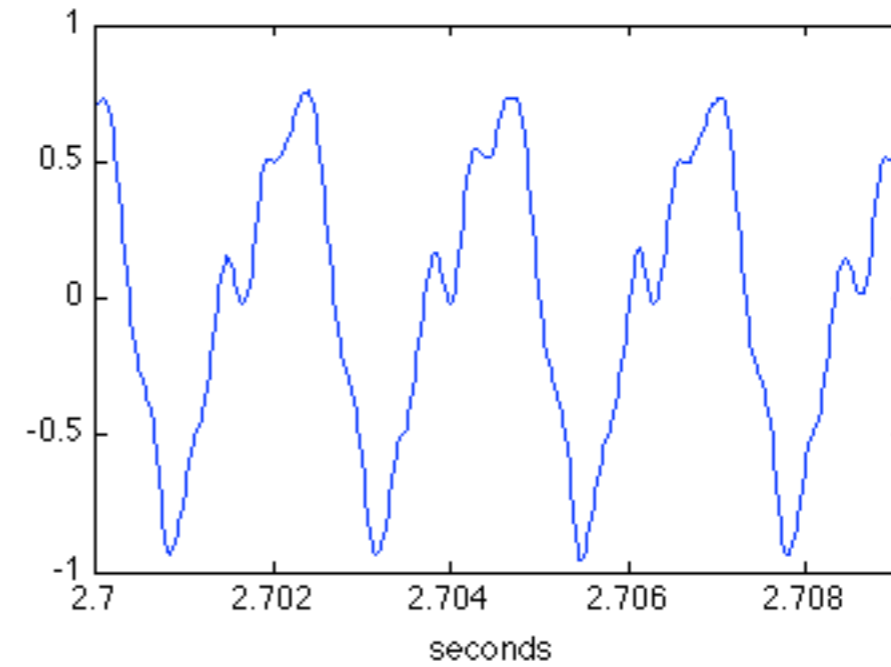
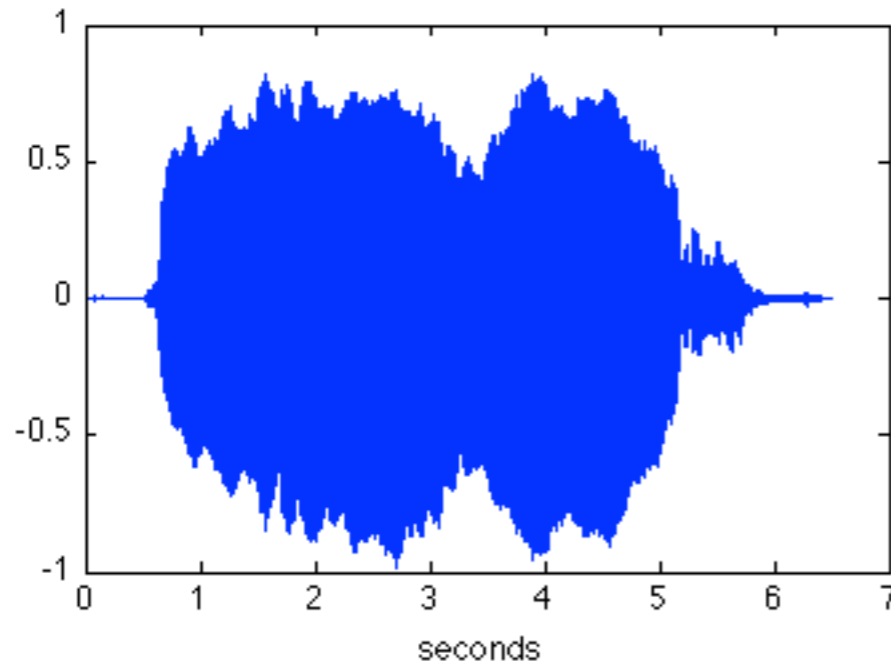
Trumpet (E4)



Sickly Violin (A4)



Sickly Violin (A4)



What is Timbre?

What is Timbre?

- ▶ Timbre is related to several waveform characteristics :
 - Envelope (macroscopic wave shape)
 - Steady state (microscopic wave shape)
 - Energy spectrum

What is Timbre?

- ▶ Timbre is related to several waveform characteristics :
 - Envelope (macroscopic wave shape)
 - Steady state (microscopic wave shape)
 - Energy spectrum

- ▶ But did you notice something...

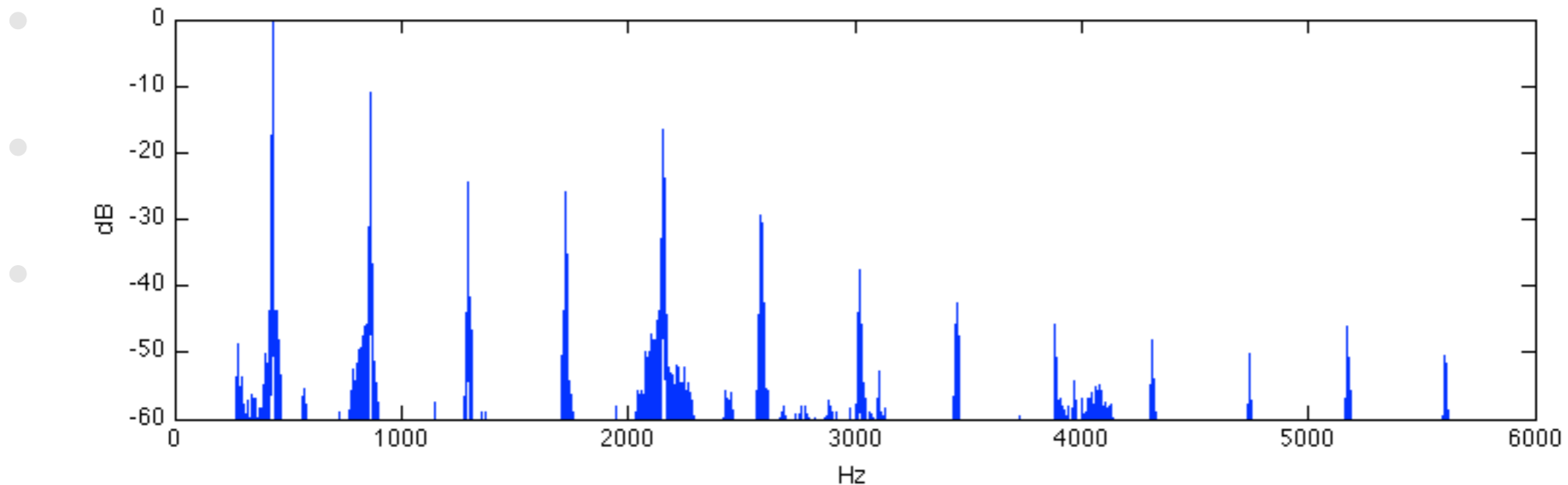
What is Timbre?

- ▶ Timbre is related to several waveform characteristics :
 - Envelope (macroscopic wave shape)
 - Steady state (microscopic wave shape)
 - Energy spectrum

- ▶ But did you notice something...in the frequency domain?

What is Timbre?

- ▶ Timbre is related to several waveform characteristics :



- ▶ But did you notice something..in the frequency domain?

A Question

- ▶ What kind of waveforms (functions) can be represented by evenly spaced pure tones?

A Question

- ▶ What kind of waveforms (functions) can be represented by evenly spaced pure tones?

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

A Question

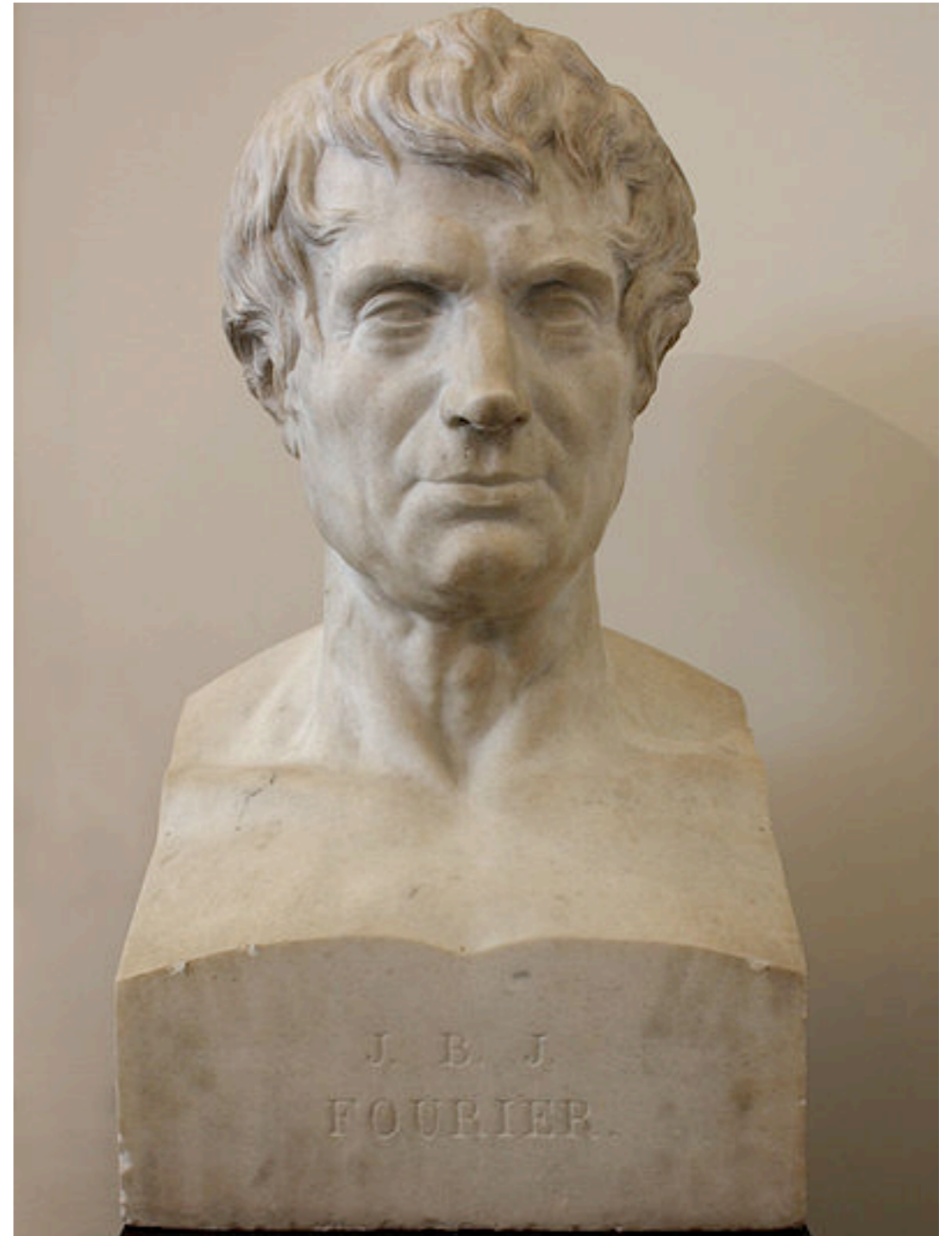
- ▶ What kind of waveforms (functions) can be represented by evenly spaced pure tones?

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

- ▶ There's a fascinating answer...

Joseph Fourier

- ▶ French, 1768 - 1830
- ▶ Commoner, orphaned at age 8
- ▶ Enthusiastic supporter of French Revolution
- ▶ Permanent Secretary of French Academy of Sciences (1822 - 1830)
- ▶ Dimensional analysis, Fourier series (1807), Fourier transform, Fourier law
- ▶ Greenhouse effect (1824, 1827)



Joseph Fourier

- ▶ French, 1768 - 1830
- ▶ Commoner, orphaned at age 8
- ▶ Enthusiastic supporter of French Revolution
- ▶ Permanent Secretary of French Academy of Sciences (1822 - 1830)
- ▶ Dimensional analysis, Fourier series (1807), Fourier transform, Fourier law
- ▶ Greenhouse effect (1824, 1827)



Joseph Fourier

- ▶ French, 1768 - 1830
- ▶ Commoner, orphaned at age 8
- ▶ Enthusiastic supporter of French Revolution
- ▶ Permanent Secretary of French Academy of Sciences (1822 - 1830)
- ▶ Dimensional analysis, Fourier series (1807), Fourier transform, Fourier law
- ▶ Greenhouse effect (1824, 1827)



Fourier and Friend?



Fourier and Friend?

Legendre



Fourier's Bold Idea

Fourier's Bold Idea

- ▶ Suppose we could write some function $s(t)$ as a combination of evenly spaced tones:

Fourier's Bold Idea

- ▶ Suppose we could write some function $s(t)$ as a combination of evenly spaced tones:

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

Fourier's Bold Idea

- ▶ Suppose we could write some function $s(t)$ as a combination of evenly spaced tones:

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

- ▶ What would the coefficients a_k and b_k have to be?

A Tale of Three Integrals

A Tale of Three Integrals

$$\int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt = \begin{cases} \frac{T}{2} & \text{if } k = n \\ 0 & \text{if } k \neq n \end{cases}$$

A Tale of Three Integrals

$$\int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt = \begin{cases} \frac{T}{2} & \text{if } k = n \\ 0 & \text{if } k \neq n \end{cases}$$

$$\int_0^T \sin(2\pi k f_0 t) \sin(2\pi n f_0 t) dt = \begin{cases} \frac{T}{2} & \text{if } k = n \\ 0 & \text{if } k \neq n \end{cases}$$

A Tale of Three Integrals

$$\int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt = \begin{cases} \frac{T}{2} & \text{if } k = n \\ 0 & \text{if } k \neq n \end{cases}$$

$$\int_0^T \sin(2\pi k f_0 t) \sin(2\pi n f_0 t) dt = \begin{cases} \frac{T}{2} & \text{if } k = n \\ 0 & \text{if } k \neq n \end{cases}$$

$$\int_0^T \cos(2\pi k f_0 t) \sin(2\pi n f_0 t) dt = 0$$

Fourier's Bold Idea

▶ Assume:

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

Fourier's Bold Idea

- ▶ Multiply by $\cos(2\pi n f_0 t)$ and integrate:

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

Fourier's Bold Idea

- ▶ Multiply by $\cos(2\pi n f_0 t)$ and integrate:

$$\int_0^T s(t) \cos(2\pi n f_0 t) dt = \sum_{k=1}^{\infty} a_k \int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$
$$+ \sum_{k=1}^{\infty} b_k \int_0^T \sin(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$


Fourier's Bold Idea

- ▶ Now pay heed to the Tale of Three Integrals:

$$\int_0^T s(t) \cos(2\pi n f_0 t) dt = \sum_{k=1}^{\infty} a_k \int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$
$$+ \sum_{k=1}^{\infty} b_k \int_0^T \sin(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$

Fourier's Bold Idea

- ▶ Now pay heed to the Tale of Three Integrals:

$$\int_0^T s(t) \cos(2\pi n f_0 t) dt = \sum_{k=1}^{\infty} a_k \int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$
$$+ \sum_{k=1}^{\infty} b_k \int_0^T \sin(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$


Fourier's Bold Idea

- ▶ Now pay heed to the Tale of Three Integrals:

$$\int_0^T s(t) \cos(2\pi n f_0 t) dt = \sum_{k=1}^{\infty} a_k \int_0^T \cos(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$

0 if $k \neq n$

$$+ \sum_{k=1}^{\infty} b_k \int_0^T \sin(2\pi k f_0 t) \cos(2\pi n f_0 t) dt$$

0

Fourier's Bold Idea

- ▶ Now pay heed to the Tale of Three Integrals:

$$\int_0^T s(t) \cos(2\pi n f_0 t) dt = a_n \frac{T}{2}$$

Fourier's Bold Idea

$$a_n = \frac{2}{T} \int_0^T s(t) \cos(2\pi n f_0 t) dt$$

Fourier's Bold Idea

- ▶ We've found a_n !

$$a_n = \frac{2}{T} \int_0^T s(t) \cos(2\pi n f_0 t) dt$$

Fourier's Bold Idea

- ▶ We've found a_n !

$$a_n = \frac{2}{T} \int_0^T s(t) \cos(2\pi n f_0 t) dt$$

- ▶ Similarly

$$b_n = \frac{2}{T} \int_0^T s(t) \sin(2\pi n f_0 t) dt$$

Fourier's Theorem (1807)

- ▶ If a function s defined on $[0, T]$ can be written as

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

then

$$a_n = \frac{2}{T} \int_0^T s(t) \cos(2\pi n f_0 t) dt$$

$$b_n = \frac{2}{T} \int_0^T s(t) \sin(2\pi n f_0 t) dt$$

The Burning Question

The Burning Question

- ▶ Which functions s defined on $[0, T]$ can be written as

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

The Burning Question

- ▶ Which functions s defined on $[0, T]$ can be written as

$$s(t) = \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

- ▶ More generally, which s can be written as

$$s(t) = a_0 + \sum_{k=1}^{\infty} a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

Fourier's (Overly) Bold Answer

Fourier's (Overly) Bold Answer

Every function!

Fourier's (Overly) Bold Answer

~~Every function!~~

A Question of Convergence

- ▶ Partial sums of the Fourier series:

$$s_N(t) = a_0 + \sum_{k=1}^N a_k \cos(2\pi k f_0 t) + b_k \sin(2\pi k f_0 t)$$

- ▶ For which s do we have

$$s_N \rightarrow s \text{ as } N \rightarrow \infty$$

(and in what sense?)

Dirichlet's Theorem (1829)



Dirichlet's Theorem (1829)

► If s satisfies the Dirichlet conditions* on $[0, T]$, then

$$\lim_{N \rightarrow \infty} s_N(t) = s(t)$$

for each t at which s is continuous.



Dirichlet's Theorem (1829)

► If s satisfies the Dirichlet conditions* on $[0, T]$, then

$$\lim_{N \rightarrow \infty} s_N(t) = s(t)$$

for each t at which s is continuous.

* (don't ask)



Riesz-Fischer Theorem (1907)

$$\text{A: } \int_0^T s^2(t) dt < \infty$$

$$\text{B: } \int_0^T (s(t) - s_N(t))^2 dt \rightarrow 0$$



Riesz-Fischer Theorem (1907)

► If s is *measurable*, then the following are equivalent:

$$\text{A: } \int_0^T s^2(t) dt < \infty$$

$$\text{B: } \int_0^T (s(t) - s_N(t))^2 dt \rightarrow 0$$



Riesz-Fischer Theorem (1907)

► If s is *measurable*, then the following are equivalent:

$$\text{A: } \int_0^T s^2(t) dt < \infty$$

$$\text{B: } \int_0^T (s(t) - s_N(t))^2 dt \rightarrow 0$$

► Note: physically,

$$\int_0^T s^2(t) dt = \text{energy of } s$$



Carleson's Theorem (1966)

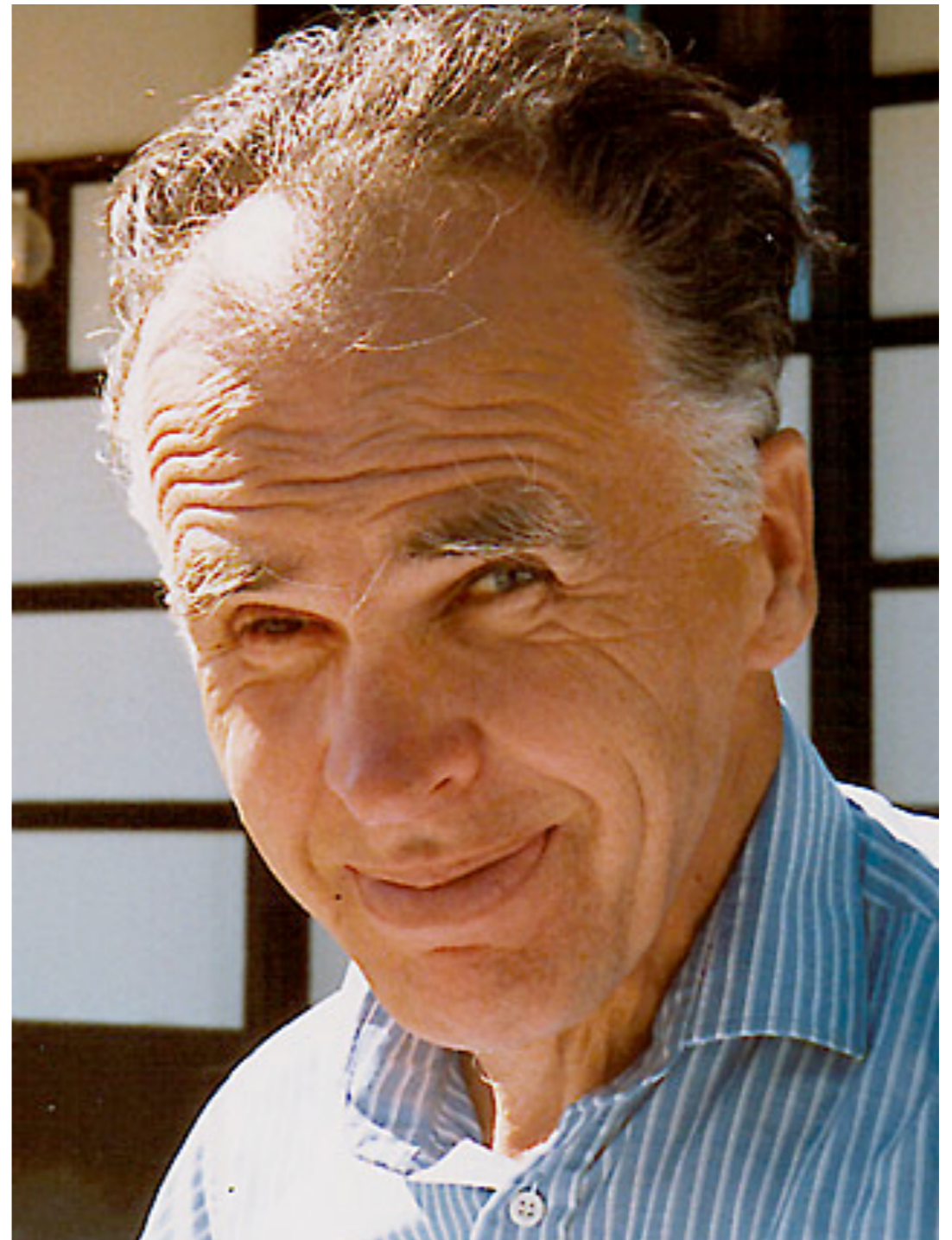
► If s is measurable, and

$$\int_0^T s^2(t) dt < \infty$$

then

$$\lim_{N \rightarrow \infty} s_N(t) = s(t)$$

for *almost every* t in $[0, T]$.



So why is Fourier smiling?



So why is Fourier smiling?

- ▶ He was wrong, but he was “essentially right!”



So why is Fourier smiling?

- ▶ He was wrong, but he was “essentially right!”
- ▶ His “bold idea” lead to a whole new field of mathematics.



So why is Fourier smiling?

- ▶ He was wrong, but he was “essentially right!”
- ▶ His “bold idea” led to a whole new field of mathematics.
- ▶ Spurred mathematicians to think more rigorously about the “function” concept.



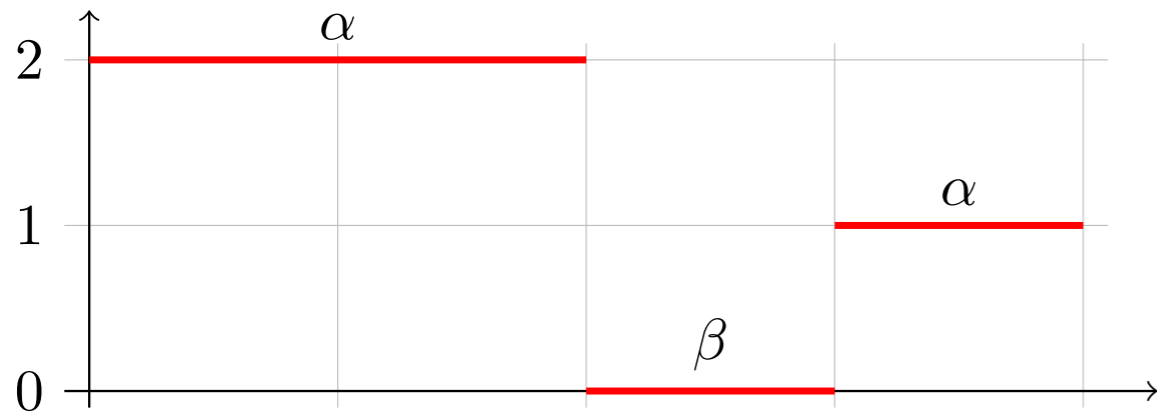
So why is Fourier smiling?

- ▶ He was wrong, but he was “essentially right!”
- ▶ His “bold idea” led to a whole new field of mathematics.
- ▶ Spurred mathematicians to think more rigorously about the “function” concept.
- ▶ His approach continues to inspire new mathematics
 - Wavelets
 - Empirical mode decomposition

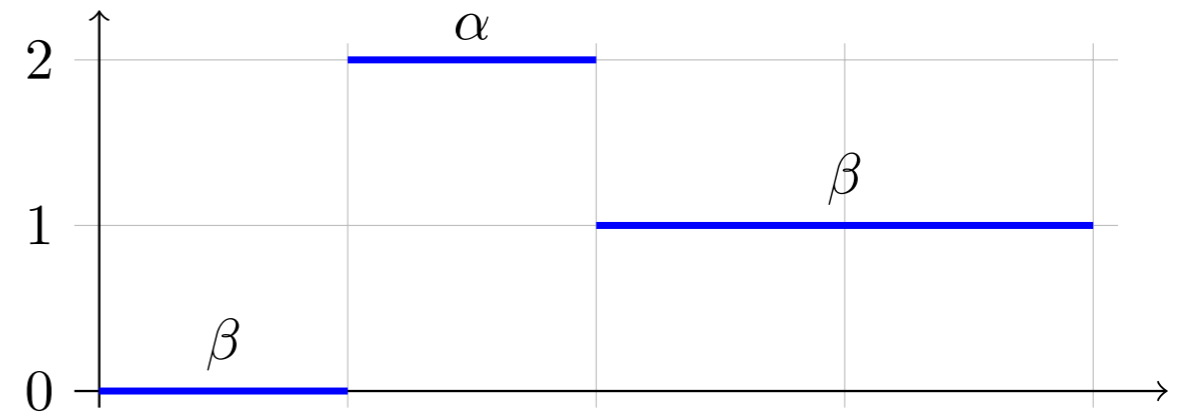


Opus 2: Fourier's Triumph

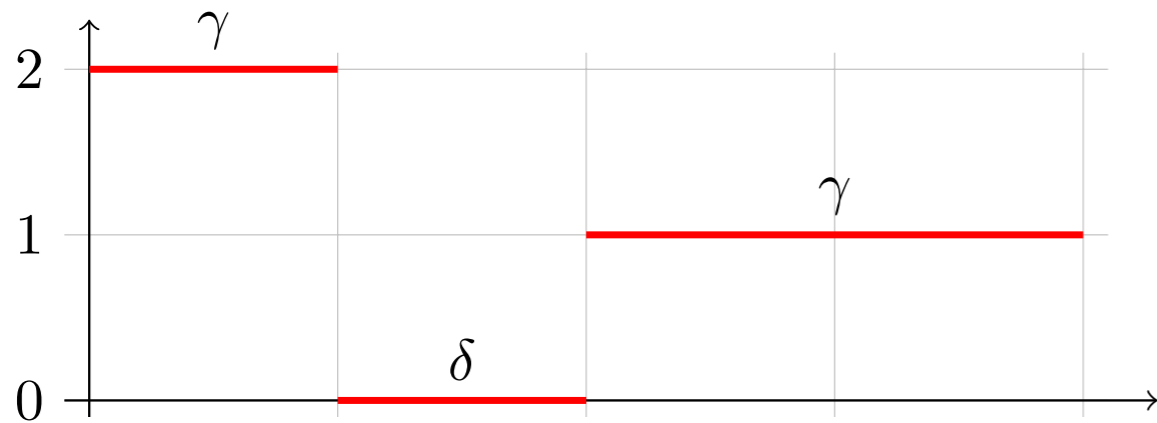
Pattern α



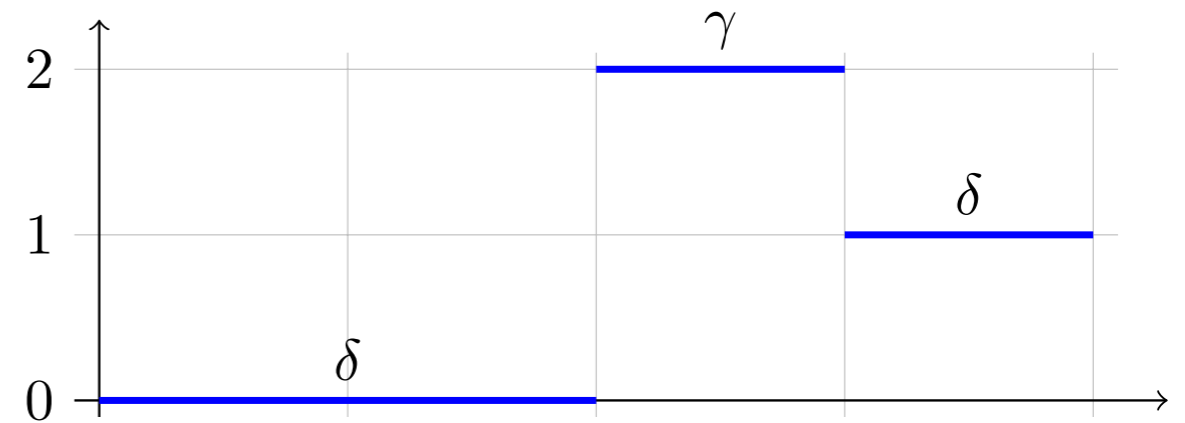
Pattern β



Pattern γ

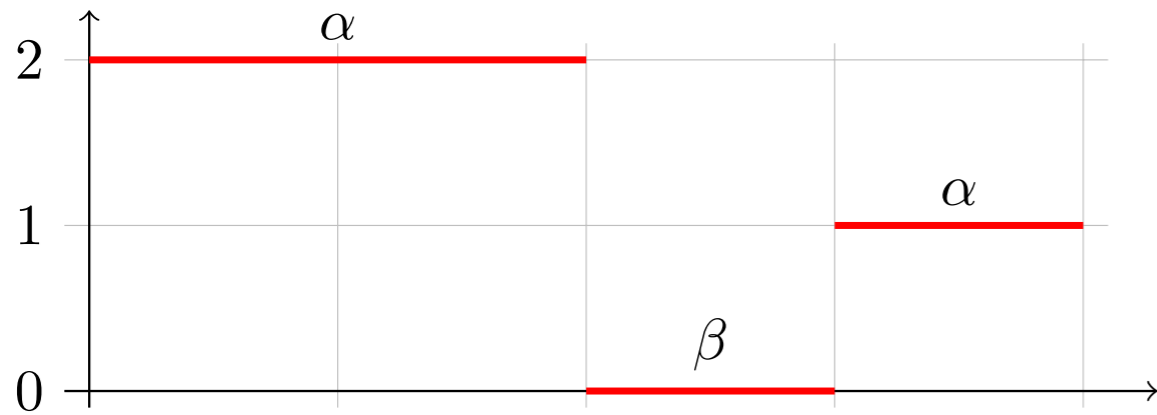


Pattern δ

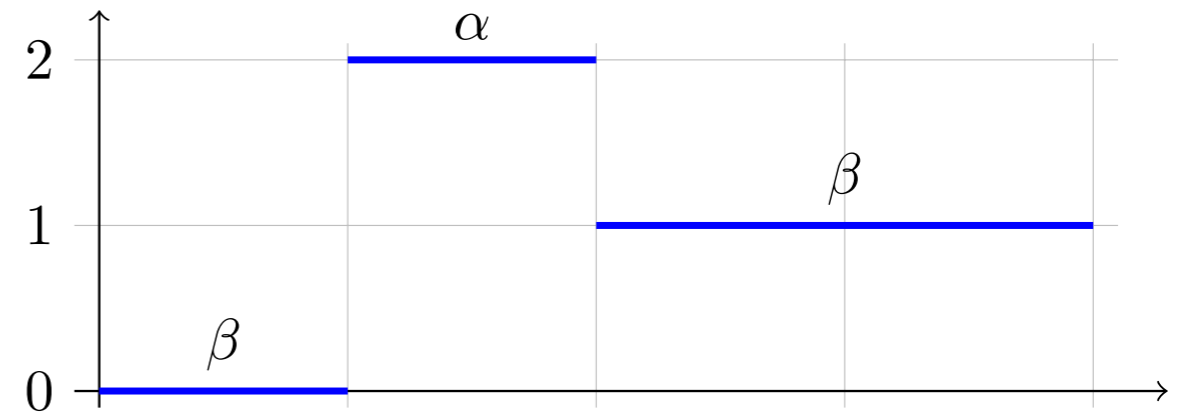


Opus 2: Fourier's Triumph

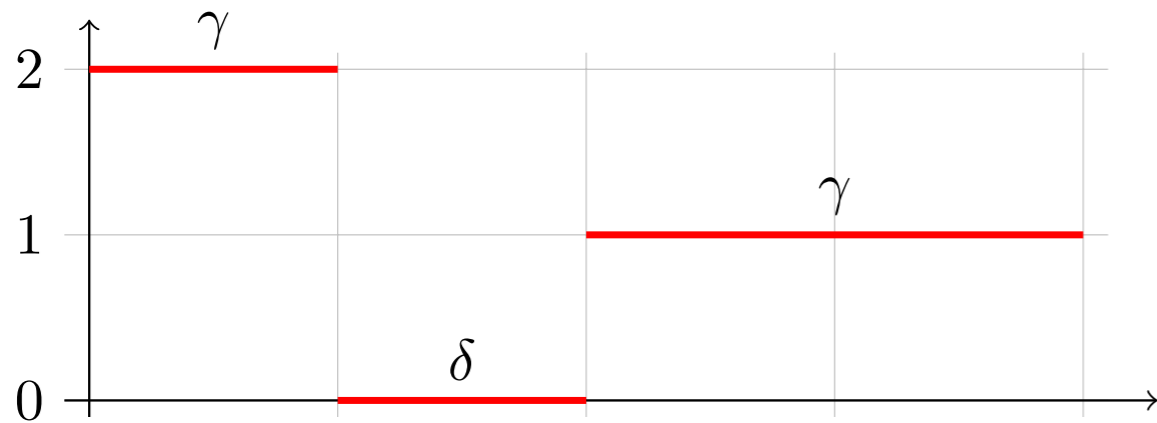
Pattern α



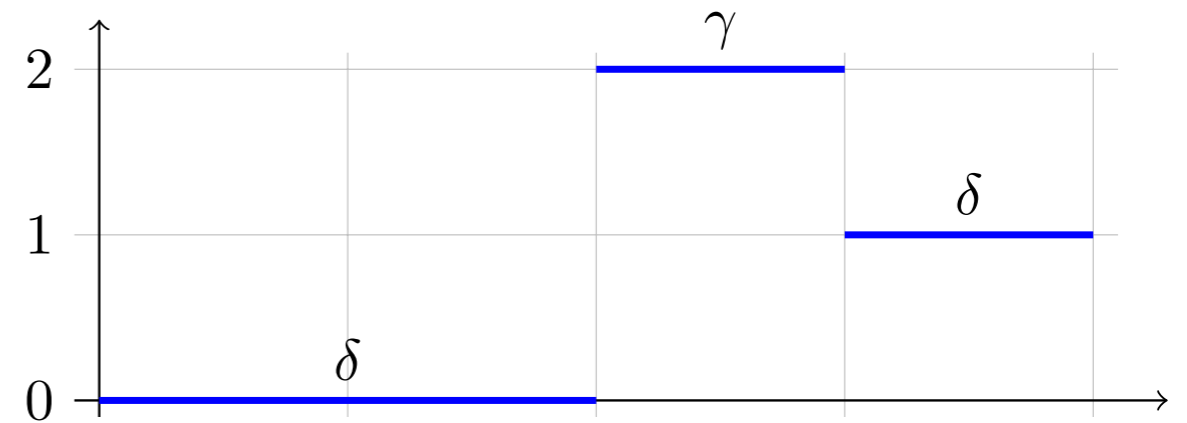
Pattern β



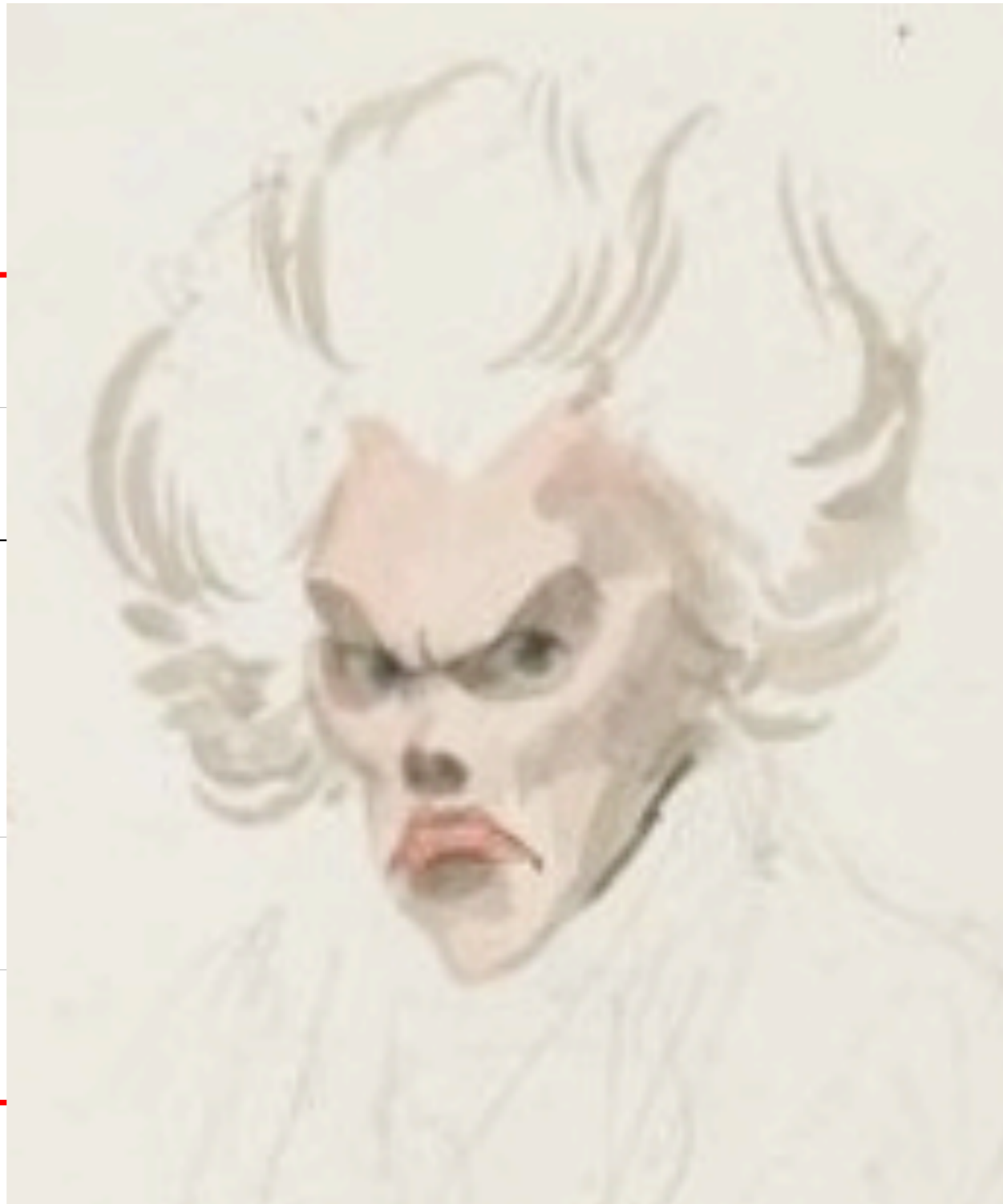
Pattern γ



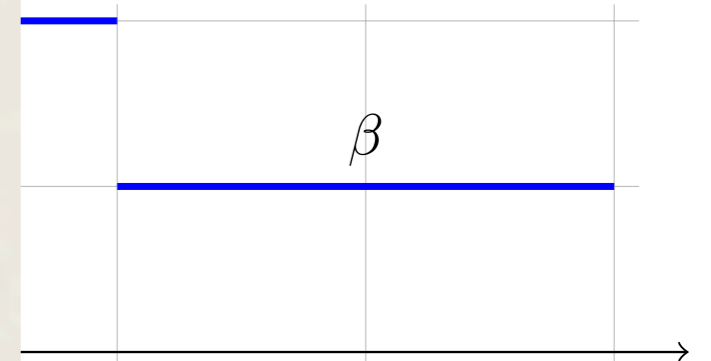
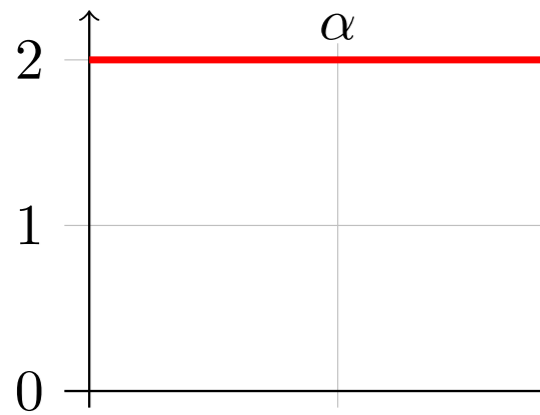
Pattern δ



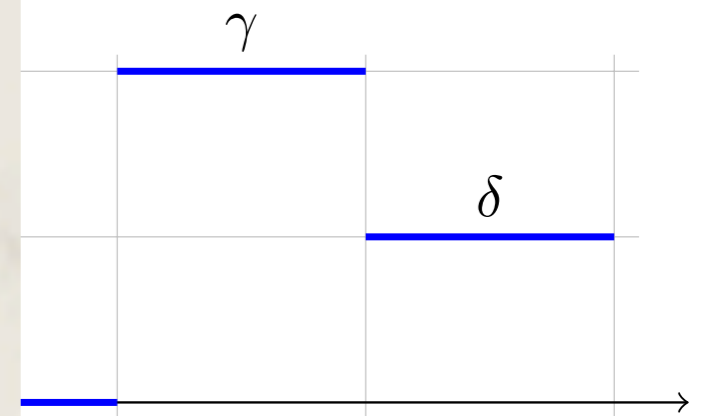
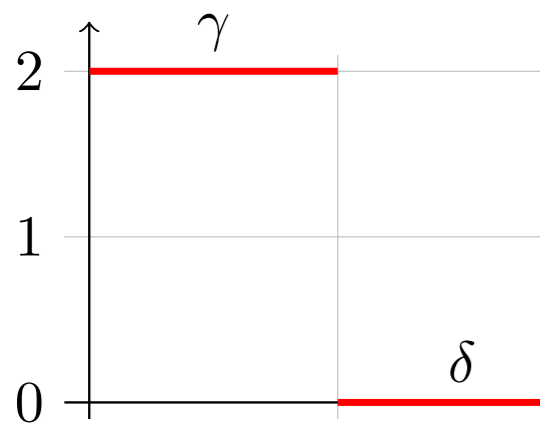
Opus 2: Fourier's Triumph



Pattern α

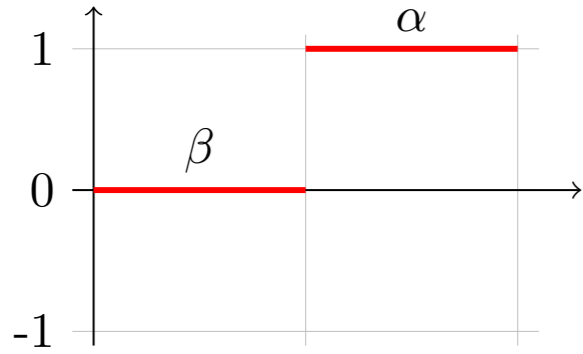


Pattern γ

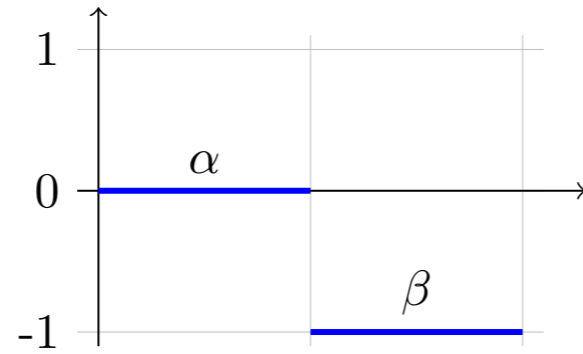


A Musical Fractal

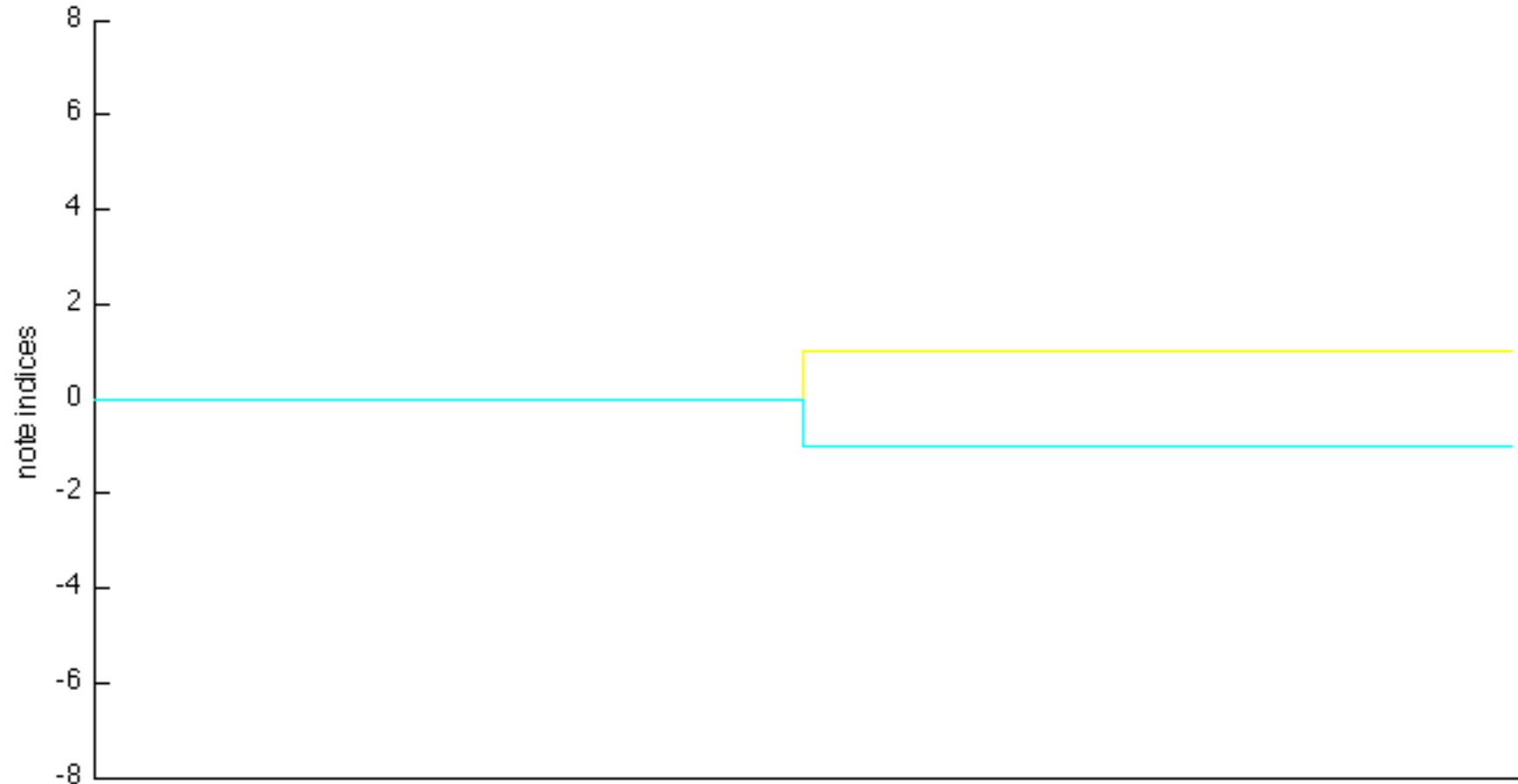
Pattern α



Pattern β

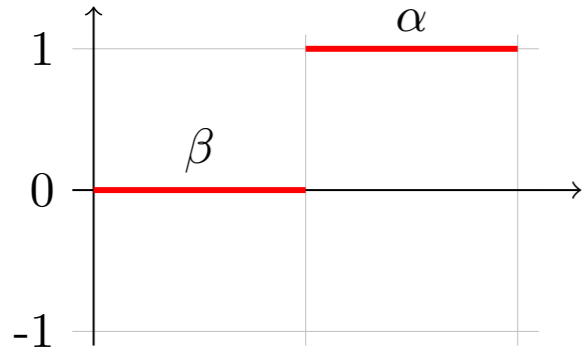


Selected Patterns

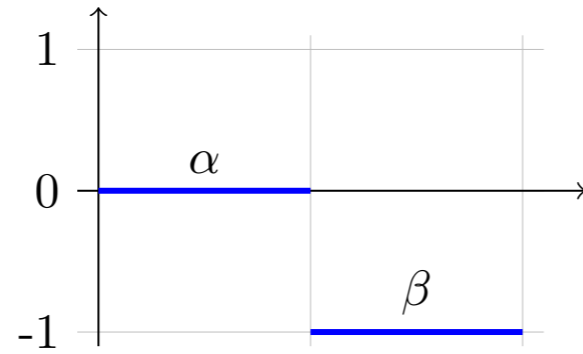


A Musical Fractal

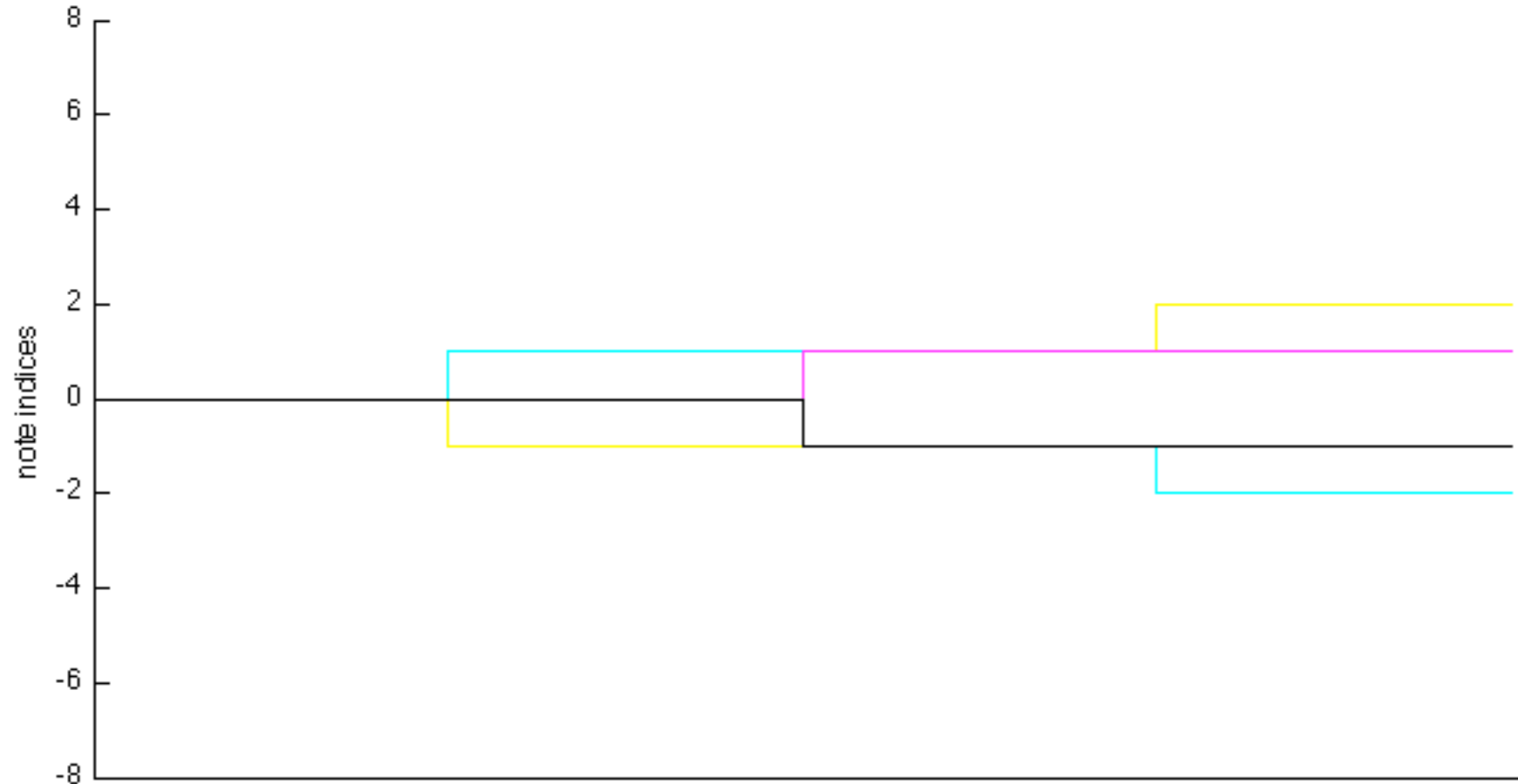
Pattern α



Pattern β

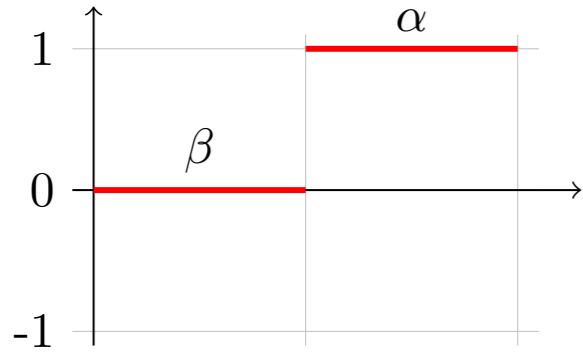


Selected Patterns

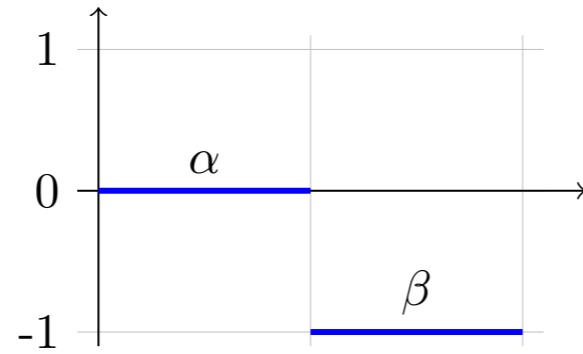


A Musical Fractal

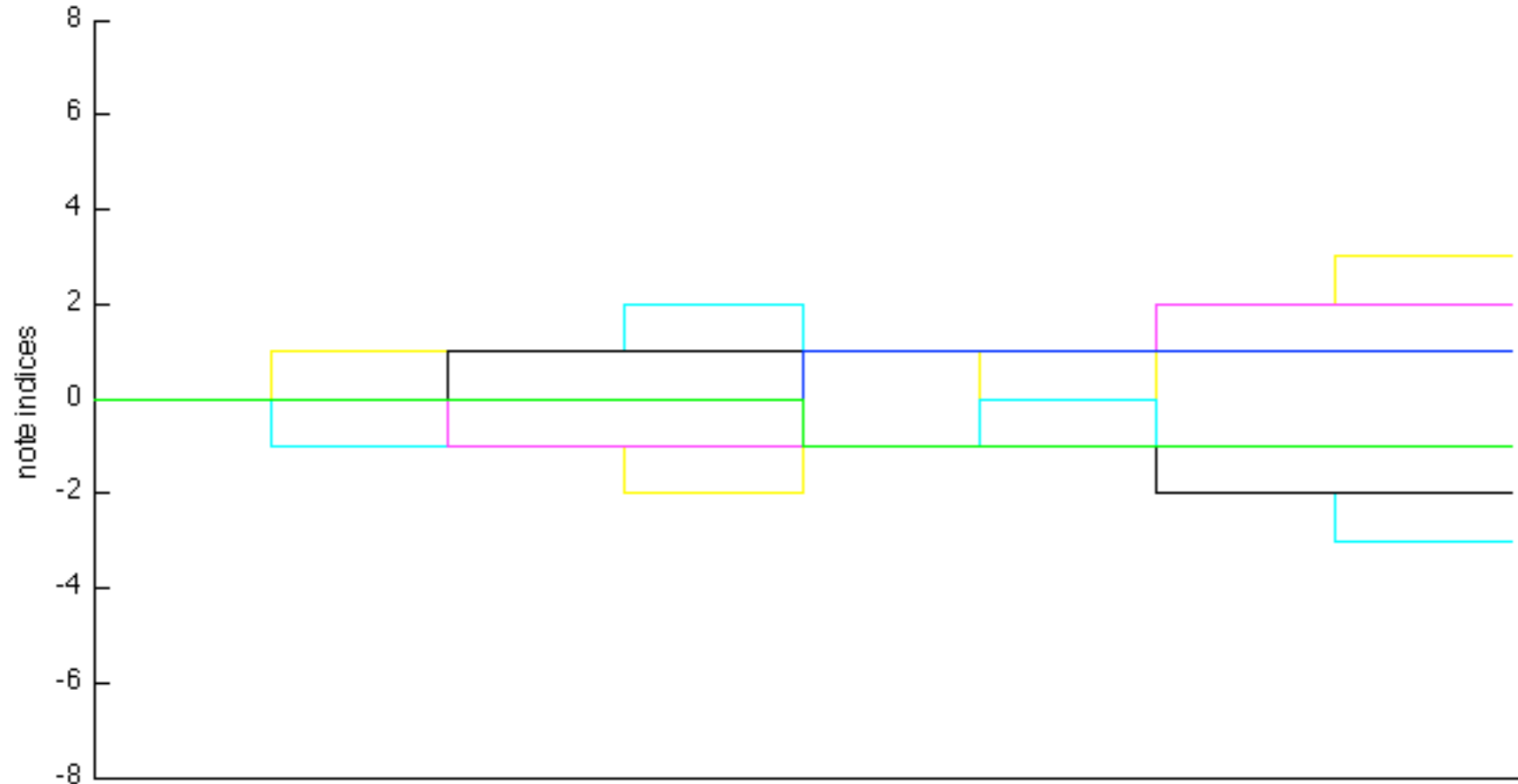
Pattern α



Pattern β

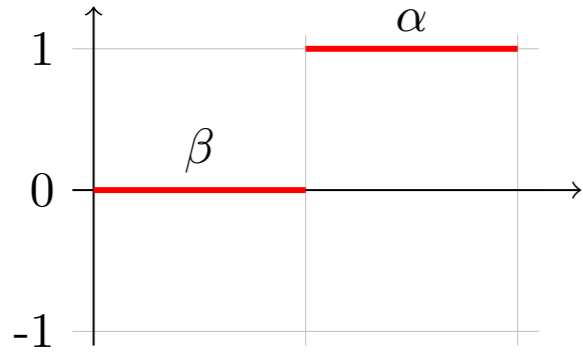


Selected Patterns

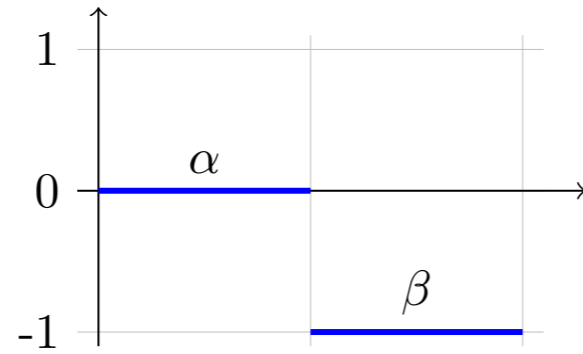


A Musical Fractal

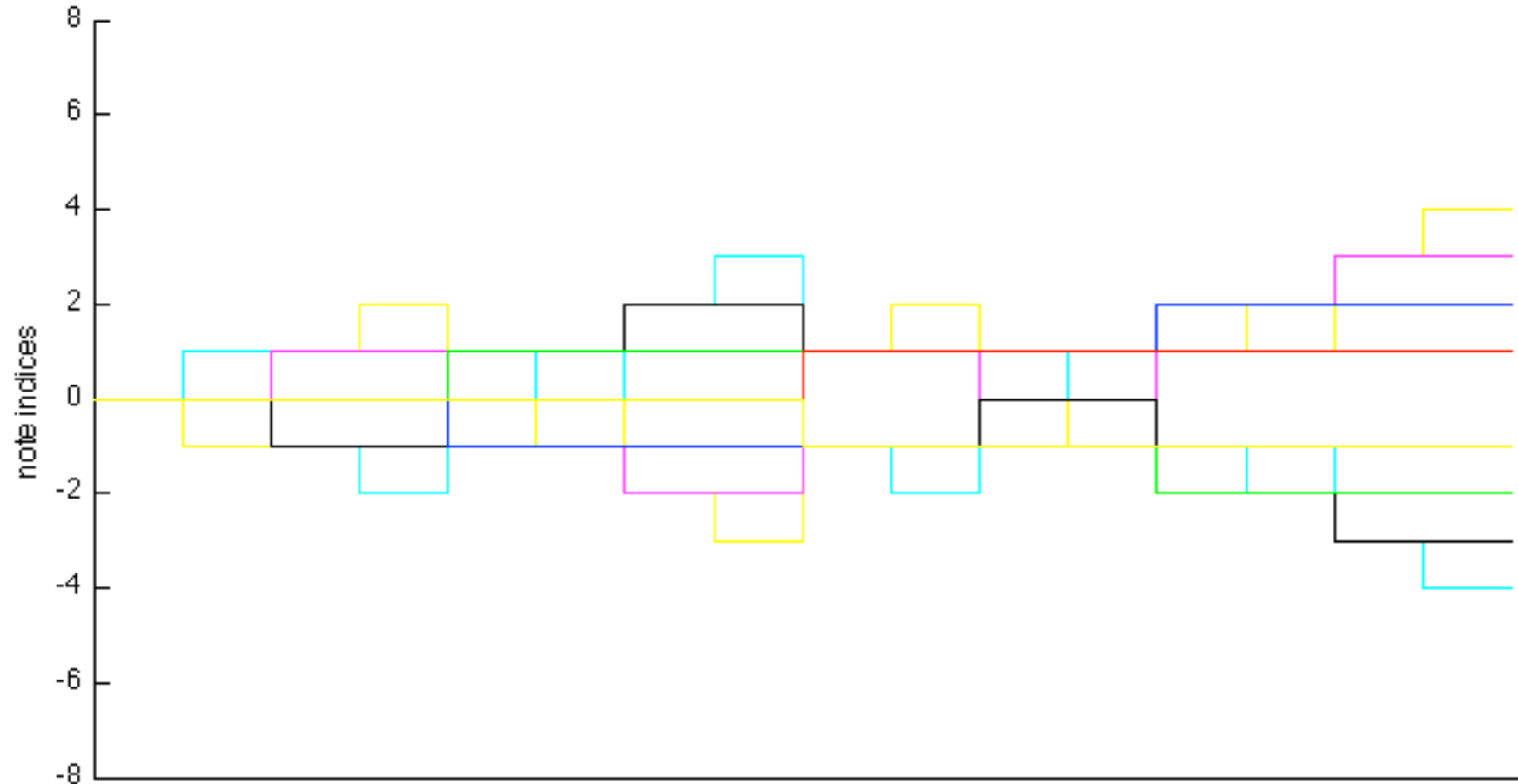
Pattern α



Pattern β

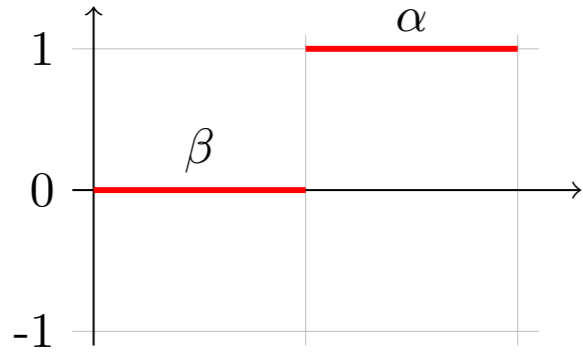


Selected Patterns

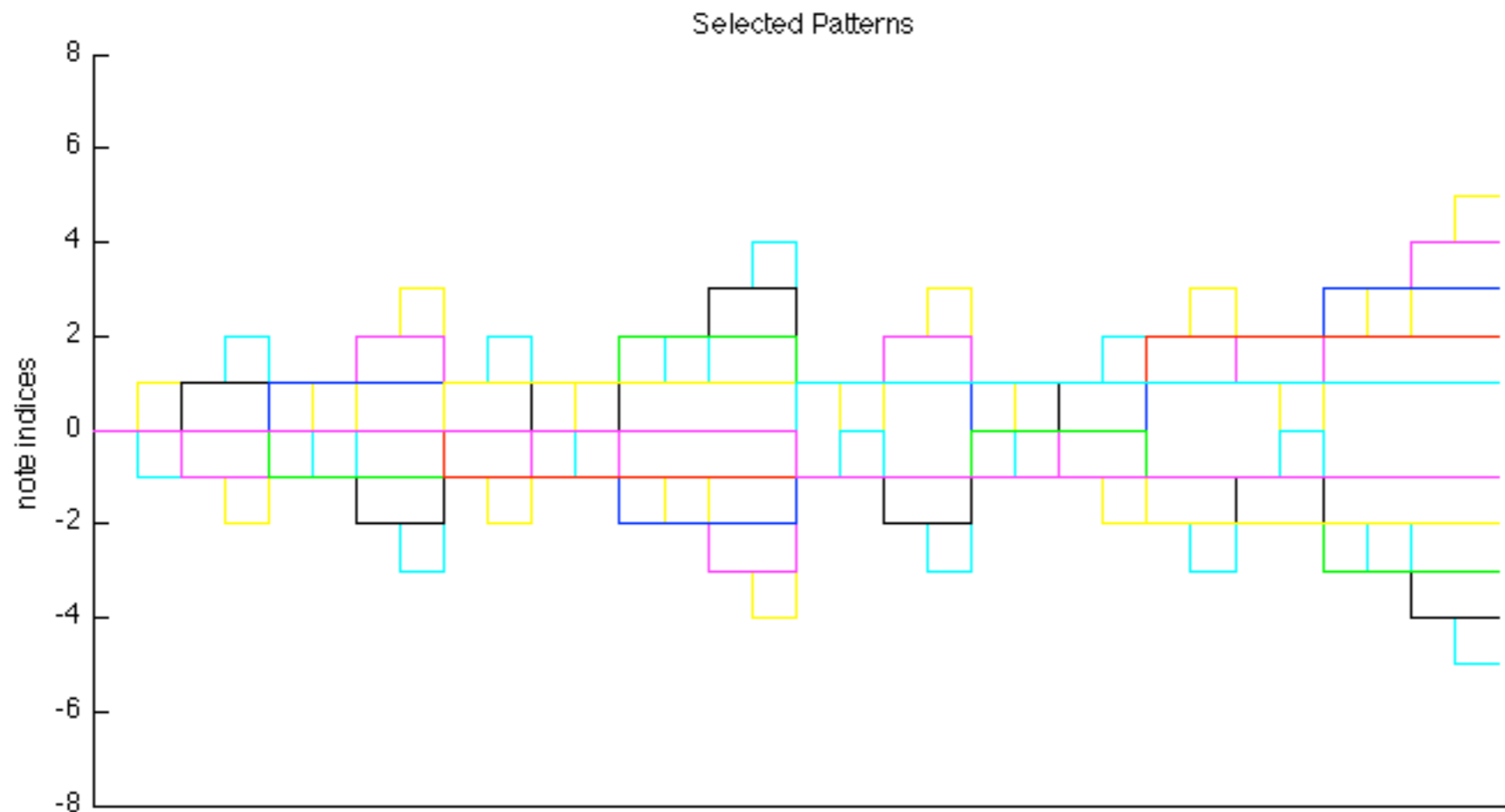
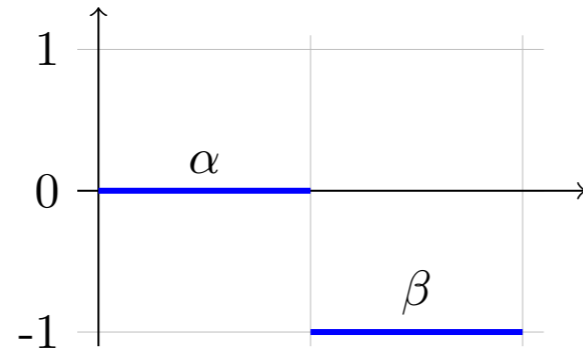


A Musical Fractal

Pattern α

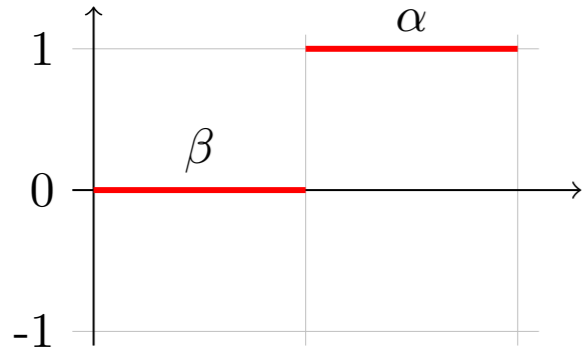


Pattern β

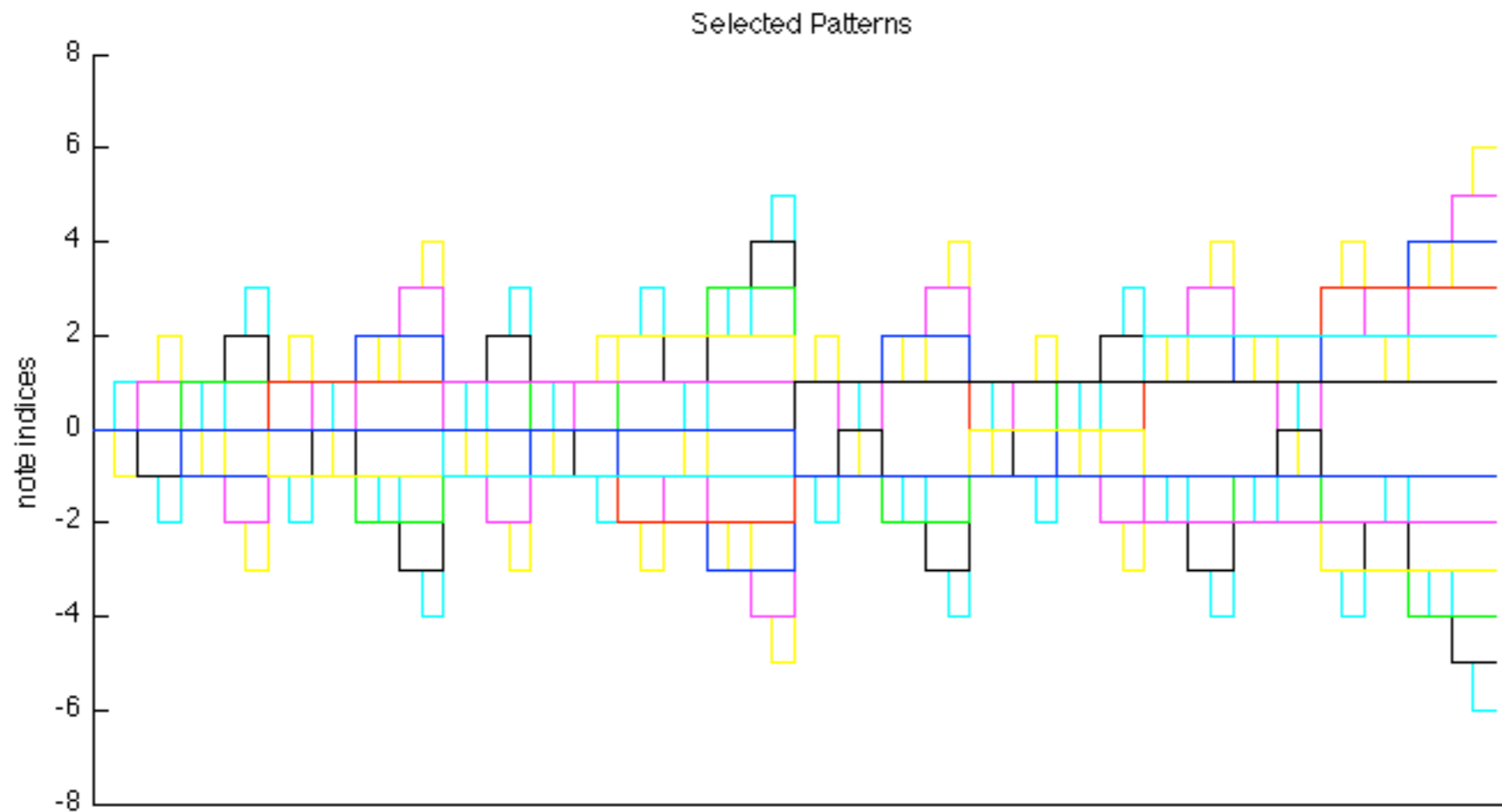
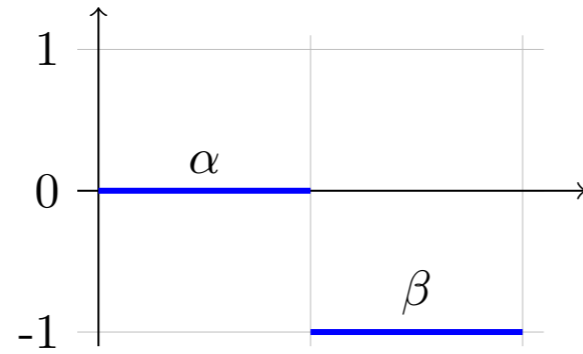


A Musical Fractal

Pattern α

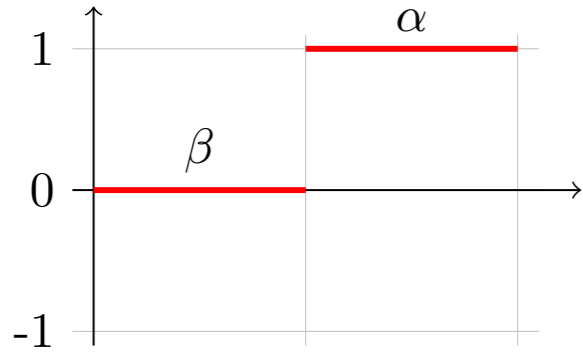


Pattern β

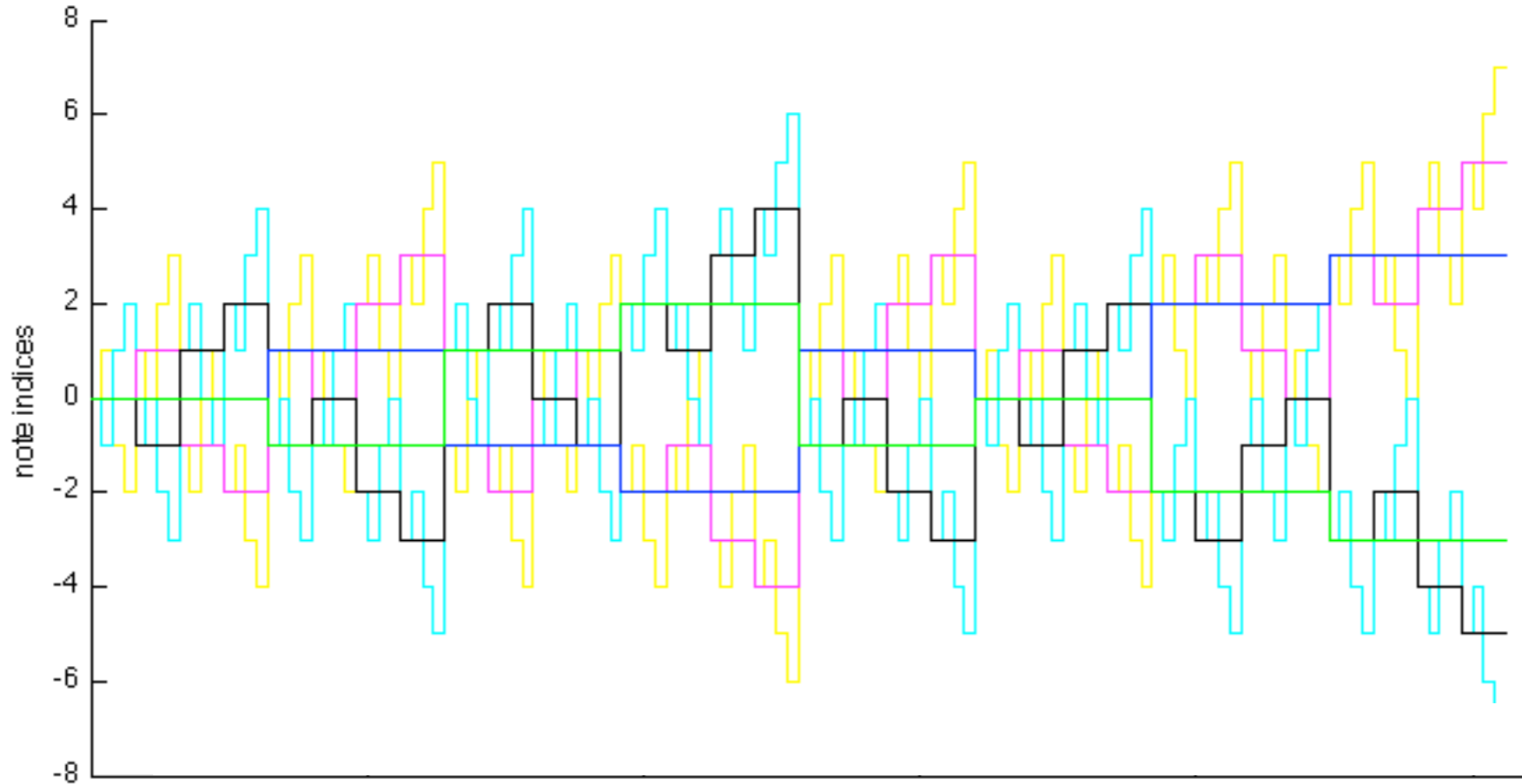
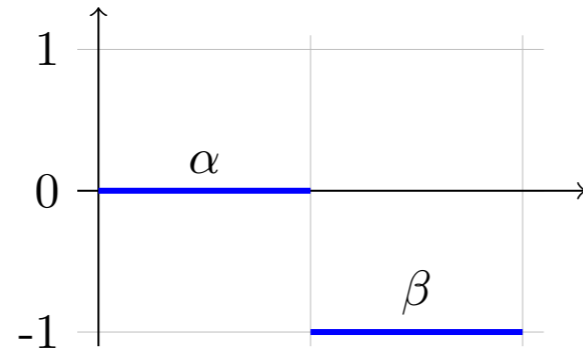


A Musical Fractal

Pattern α

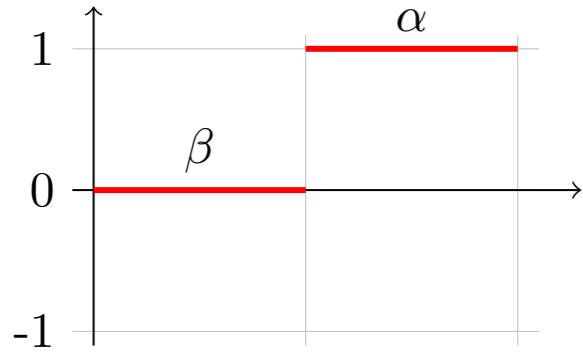


Pattern β

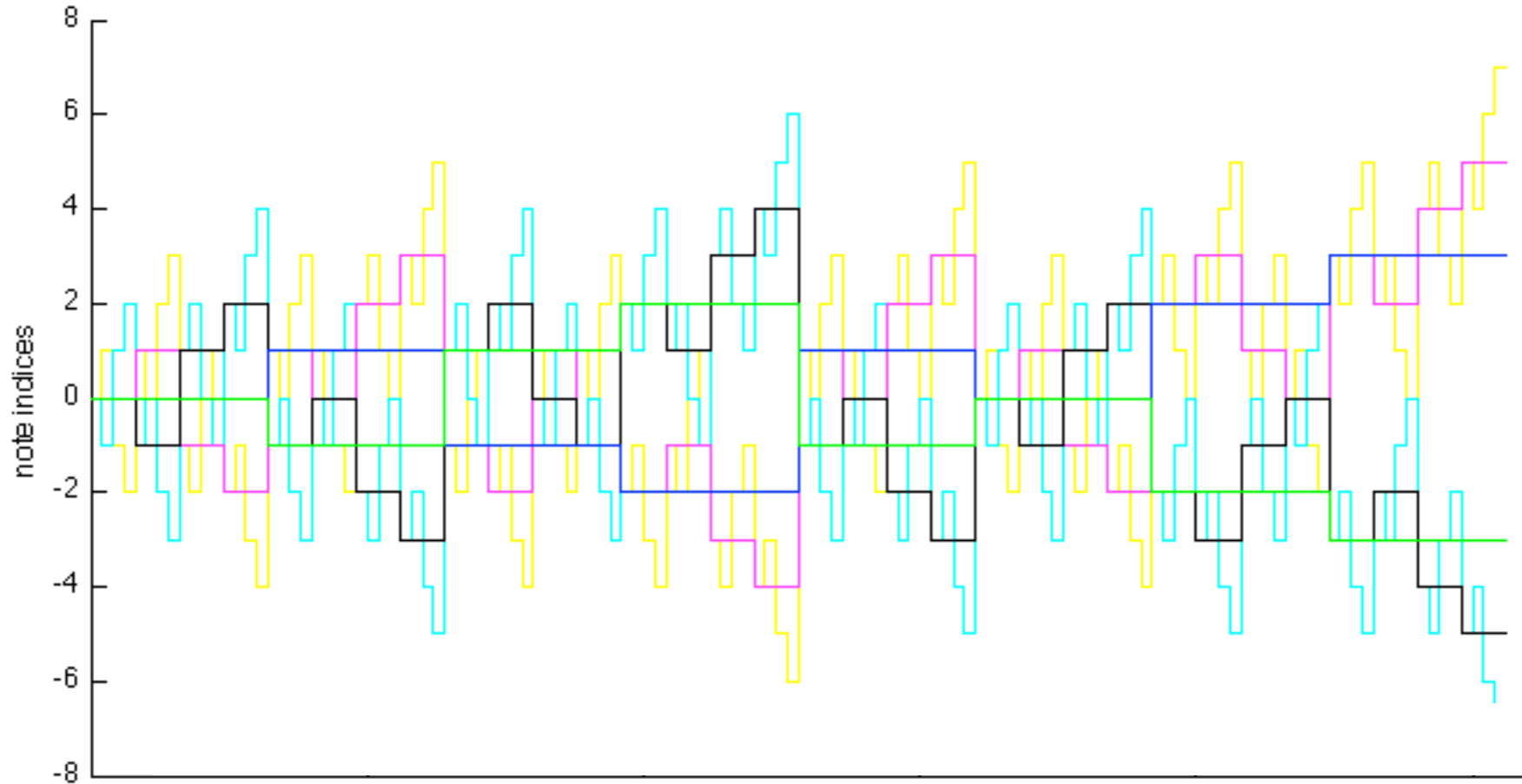
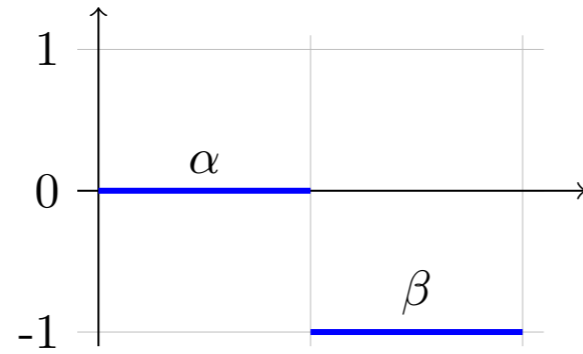


A Musical Fractal

Pattern α

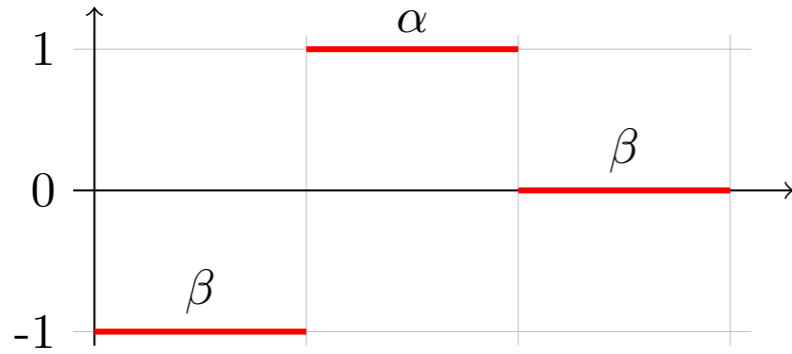


Pattern β

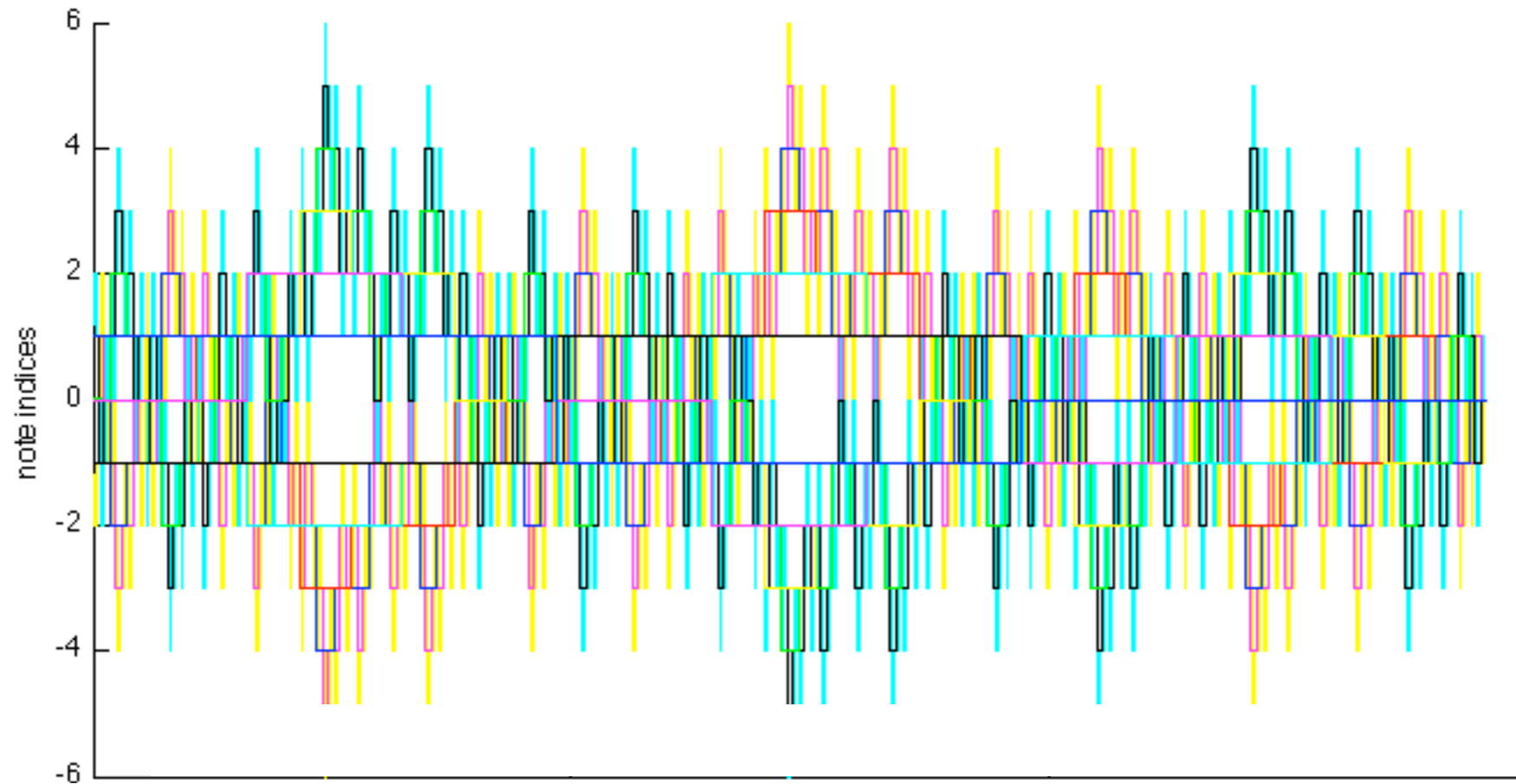
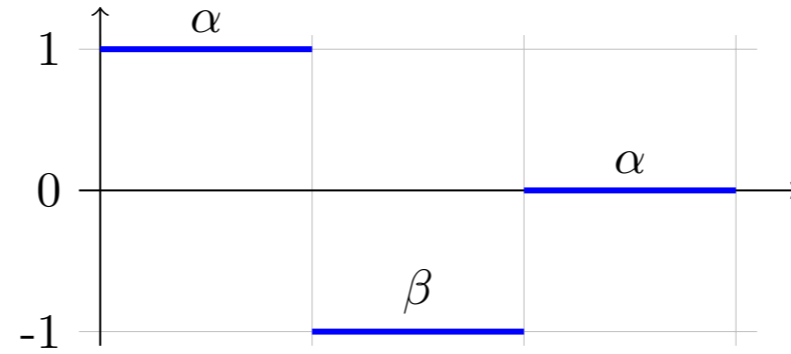


Another Musical Fractal

Pattern α

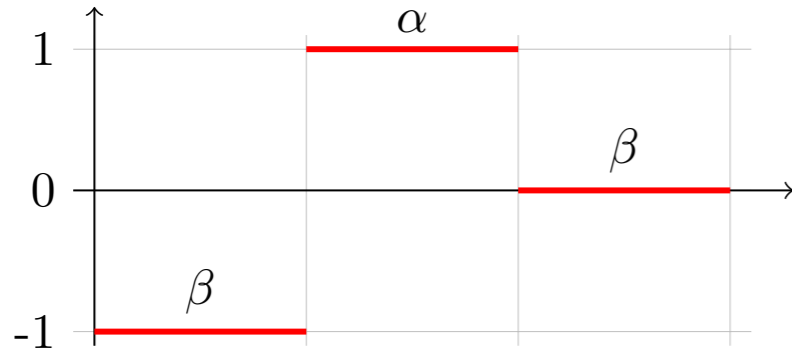


Pattern β

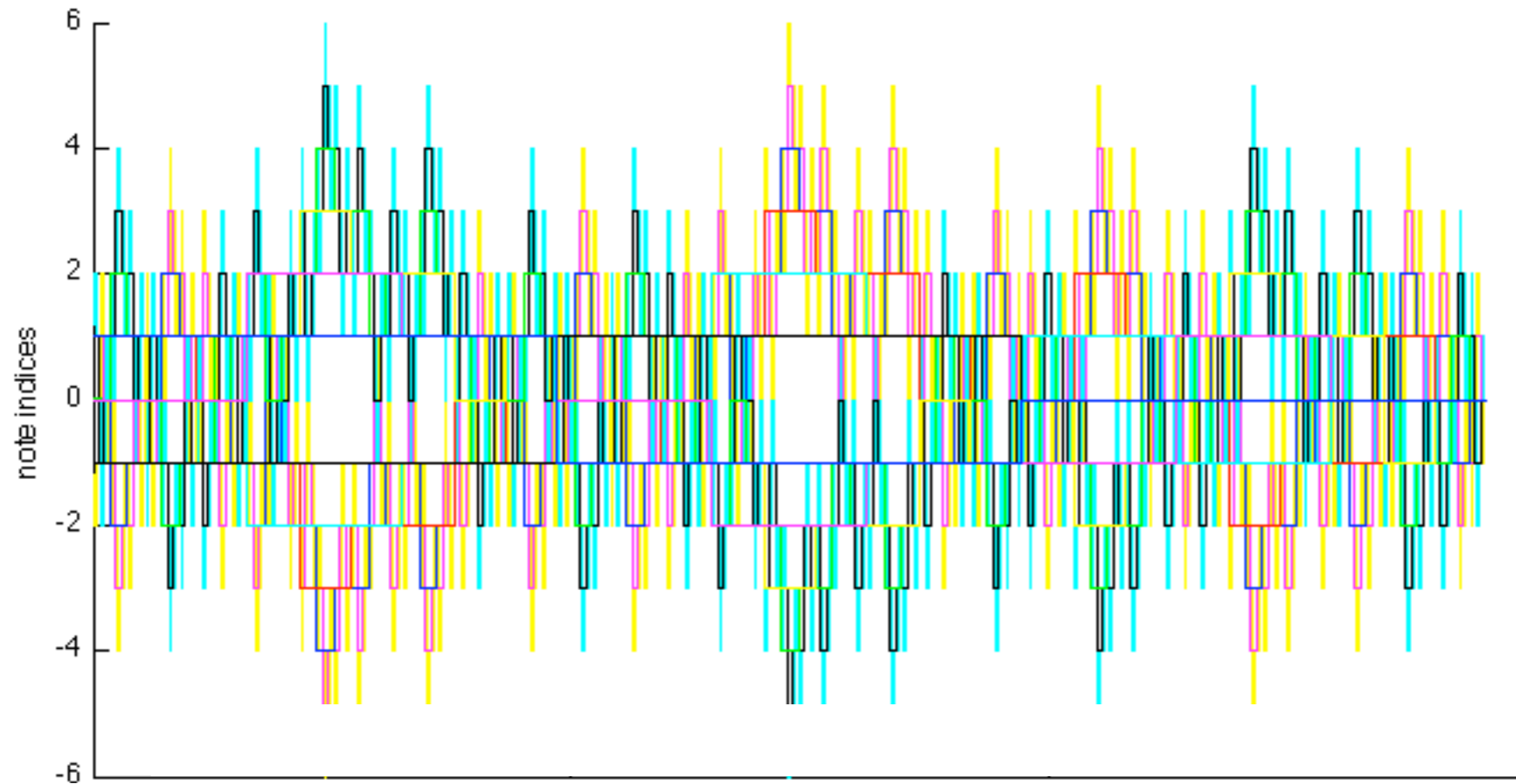
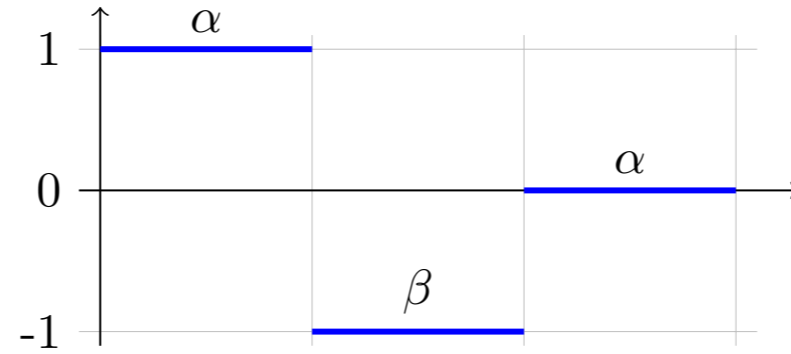


Another Musical Fractal

Pattern α

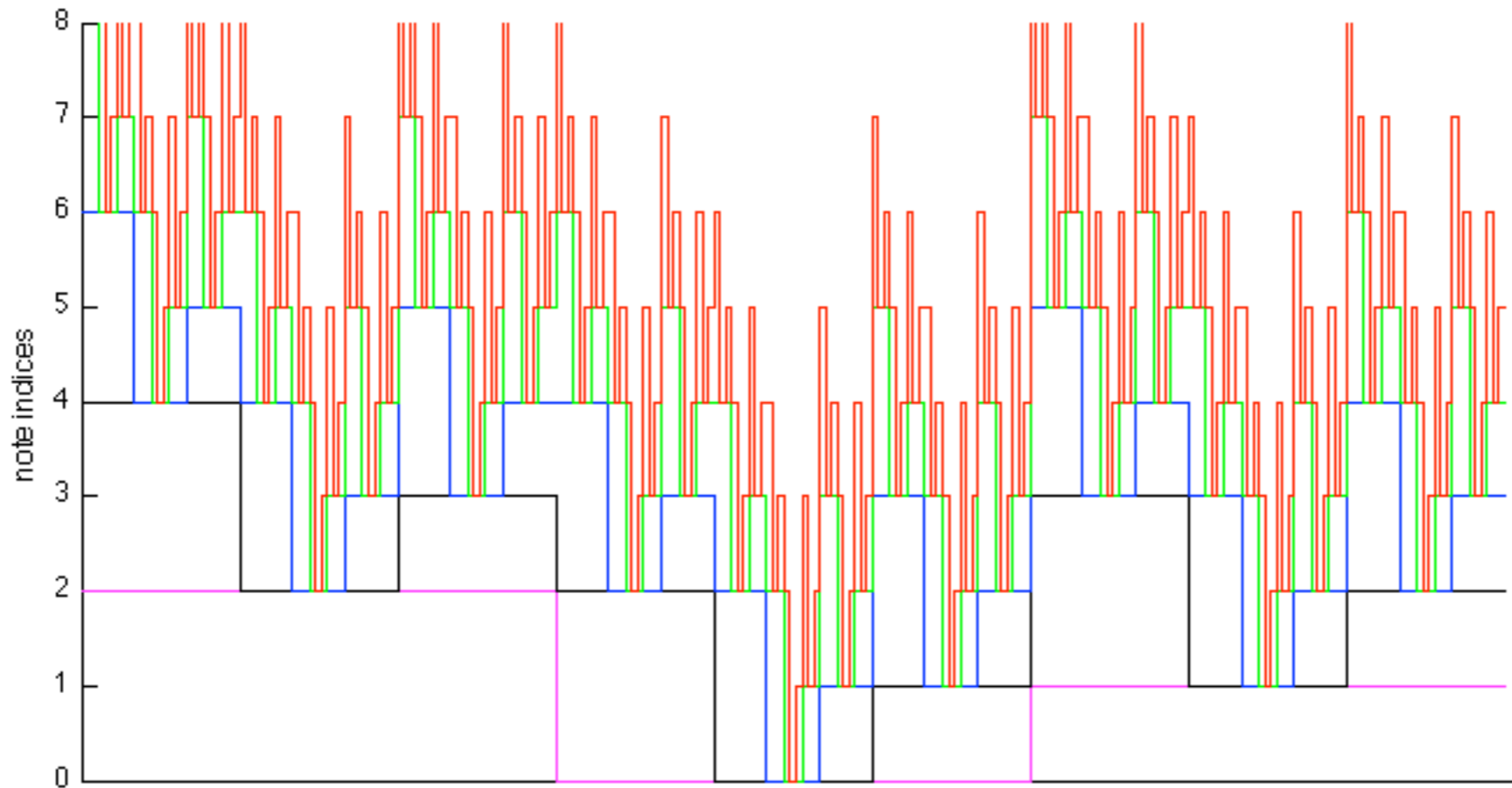
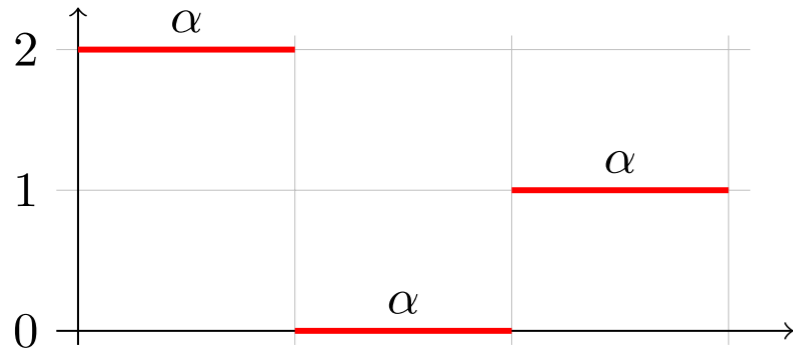


Pattern β



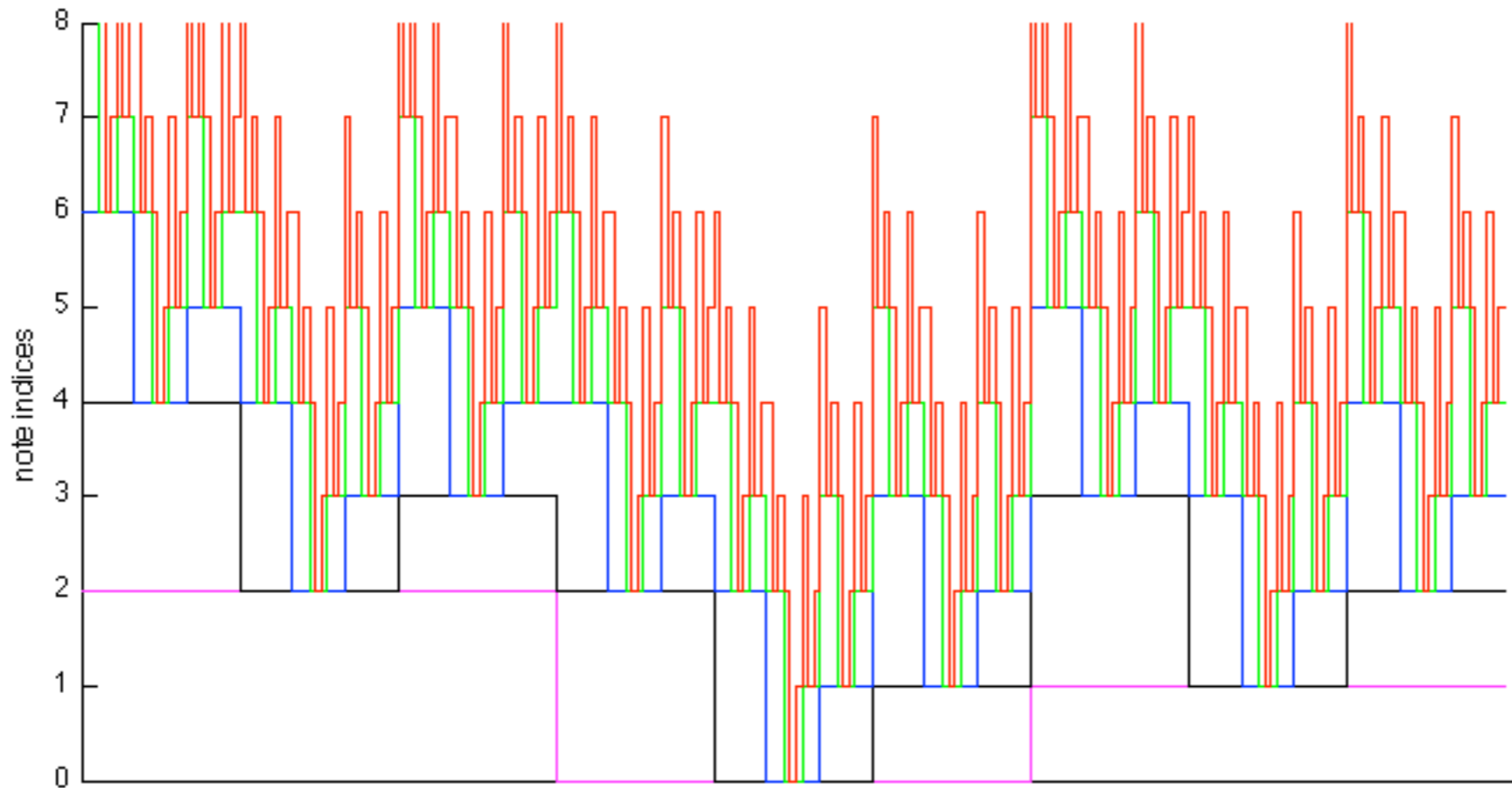
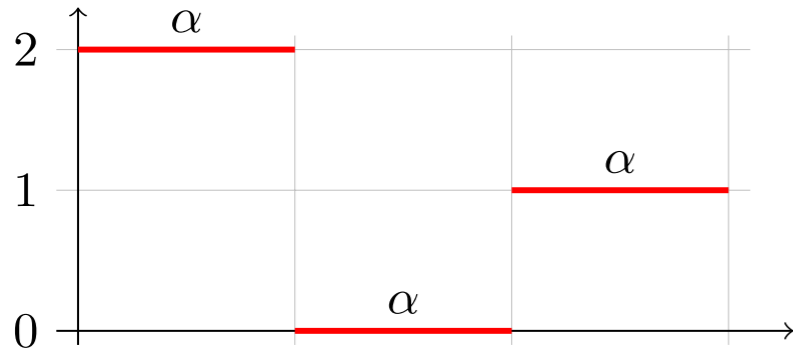
And Another...

Pattern α



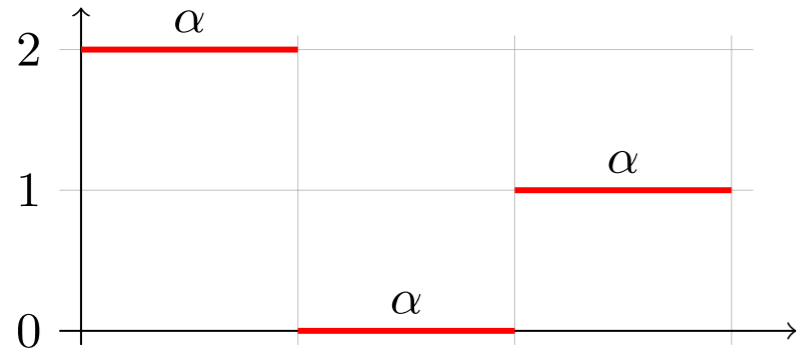
And Another...

Pattern α



Self-Similarity

Pattern α



$\alpha^{(n)}$

$\alpha^{(n-1)}$

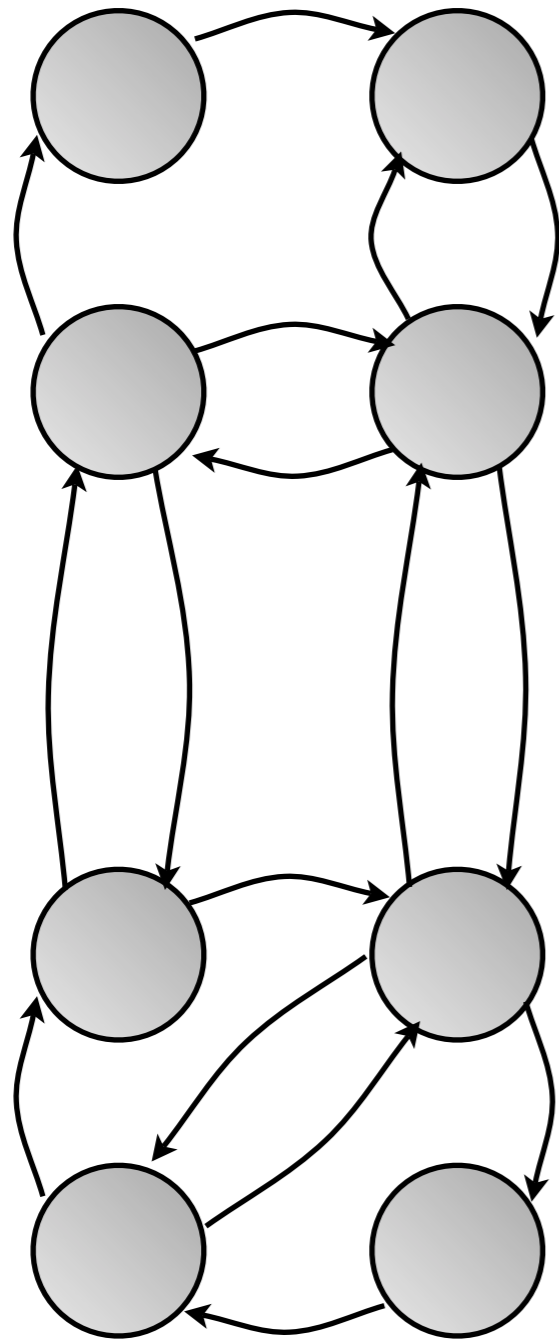
$\alpha^{(n-2)}$

Three staves of musical notation in 3/4 time, each starting with a treble clef. The top staff, labeled $\alpha^{(n)}$, contains a complex melody with eighth and sixteenth notes. The middle staff, labeled $\alpha^{(n-1)}$, contains a simpler melody with quarter notes. The bottom staff, labeled $\alpha^{(n-2)}$, contains a very simple melody with three dotted half notes.

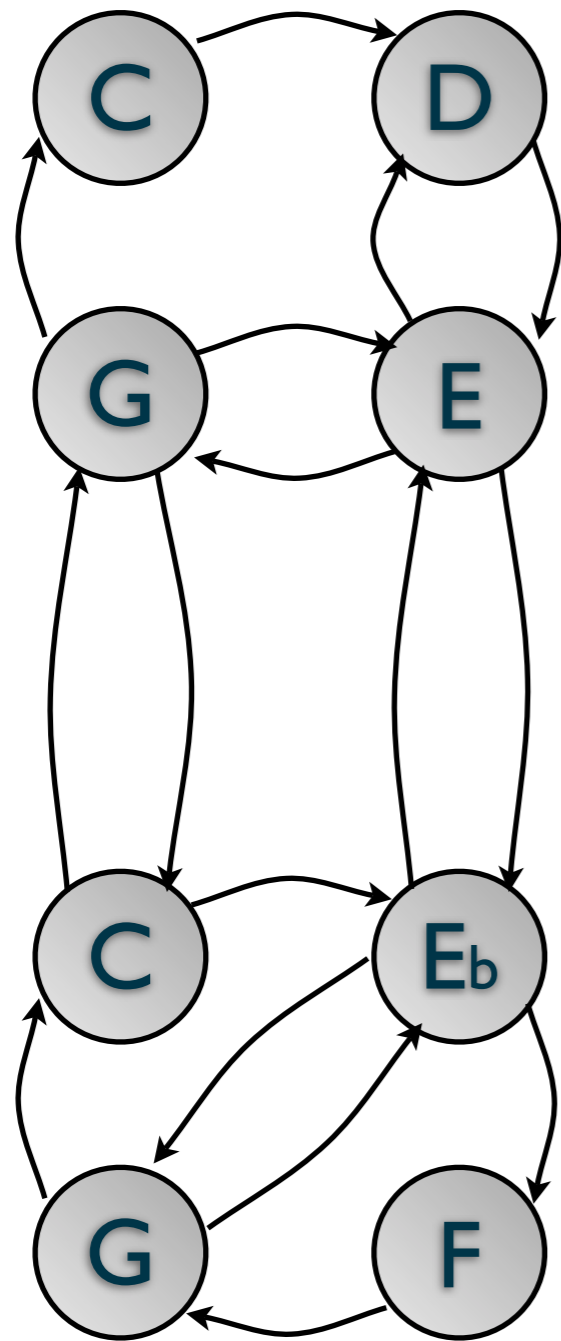
A Musical Markov Chain



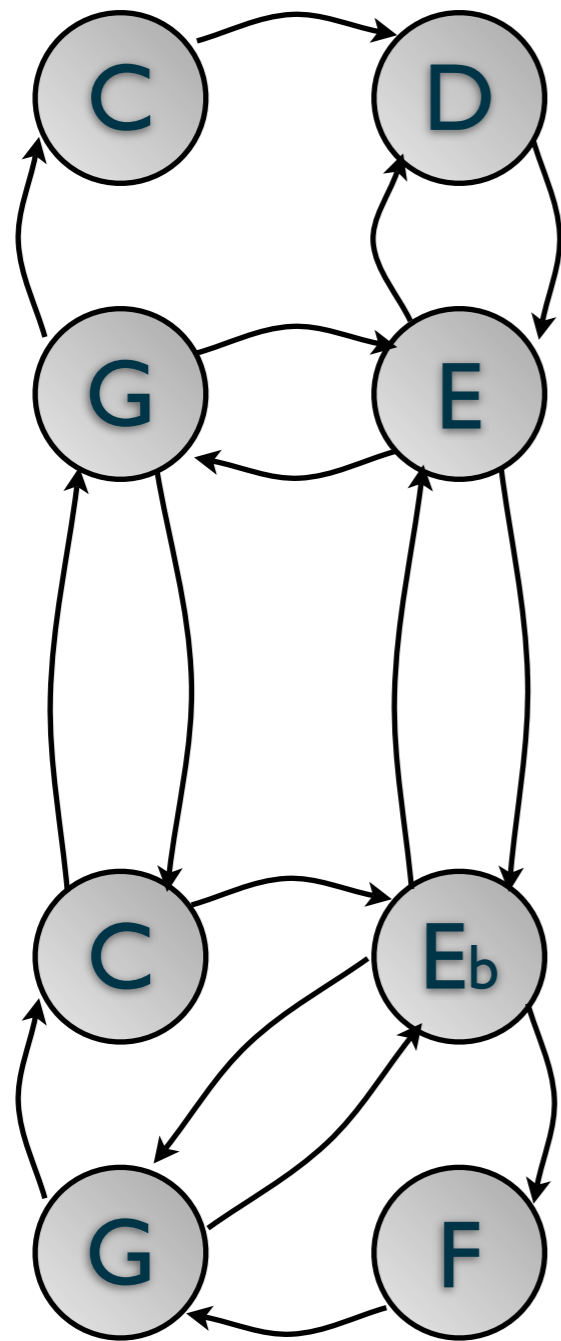
A Musical Markov Chain



A Musical Markov Chain



A Musical Markov Chain



A Musical Escher



A Musical Escher



