

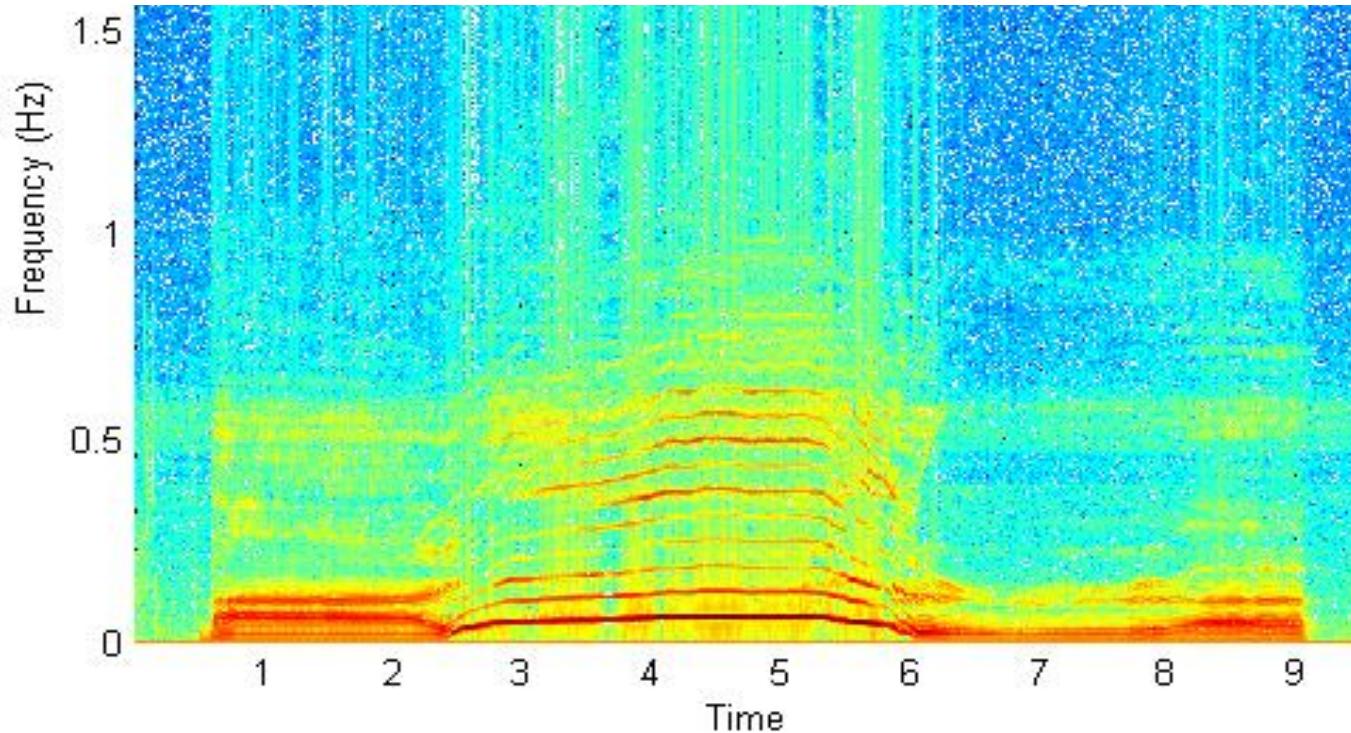
Topic

Chromagram & Cesptrogram

The Spectrogram



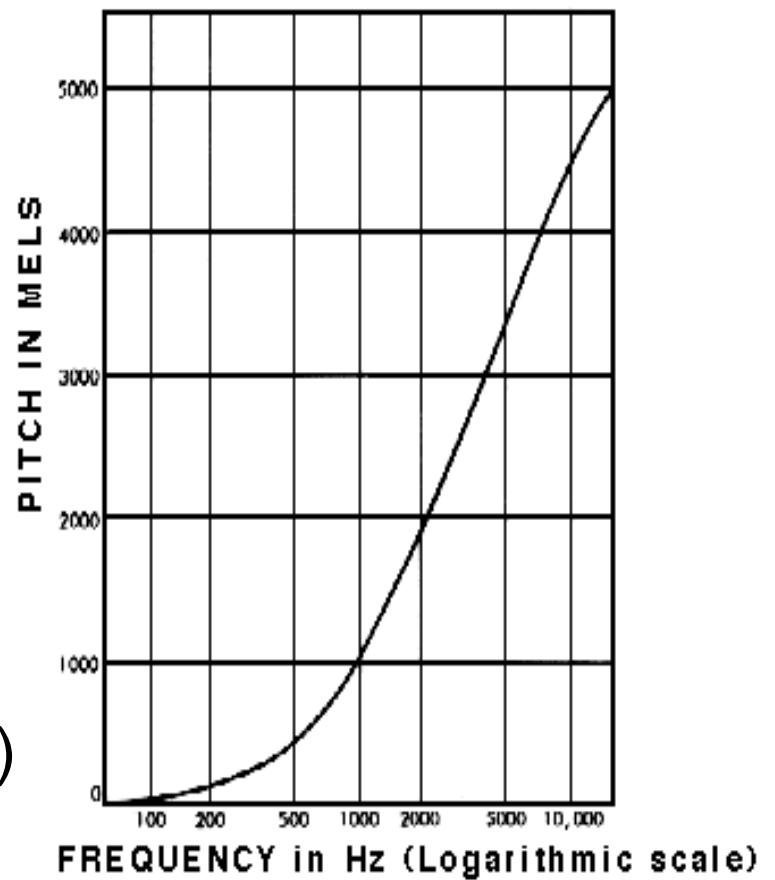
[`spectrogram\(y,1024,512,1024,fs,'yaxis'\);`](#)



- A series of short term DFTs
- Typically just displays the magnitudes of X from 0 Hz to Nyquist rate

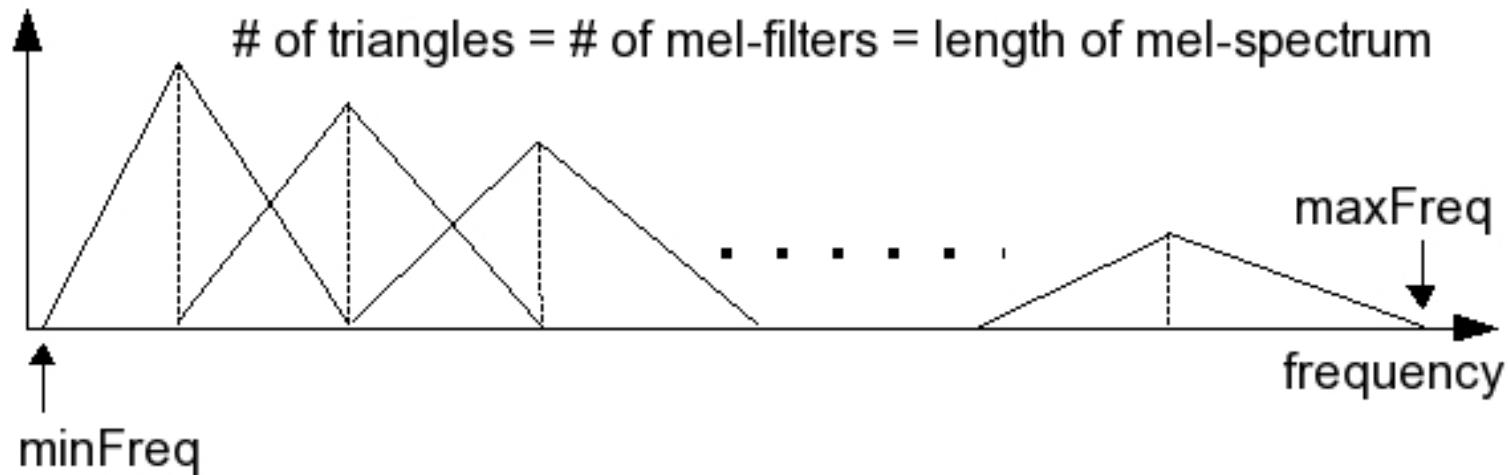
Mel Scale

- Stevens, Volkmann and Newmann (1937)
- A scale of pitches judged by listeners to be equidistant.
- The reference point:
 - 1000 mels = 1000 Hz at 40 dB SPL
- Below 500Hz mel \approx hertz
- Above 1000 Hz mel \approx $\log(\text{hertz})$



From: Appleton and Perera, eds., *The Development and Practice of Electronic Music*, Prentice-Hall, 1975, p. 56; after Stevens and Davis, Hearing

Mel Filter Bank

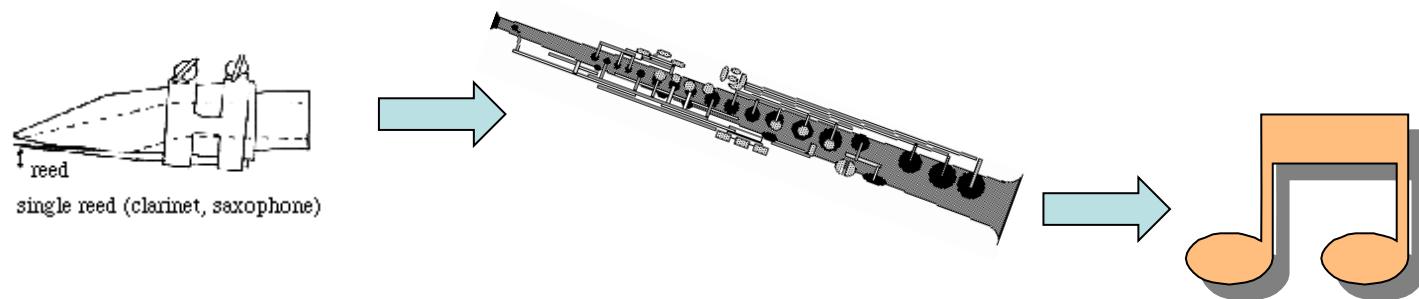
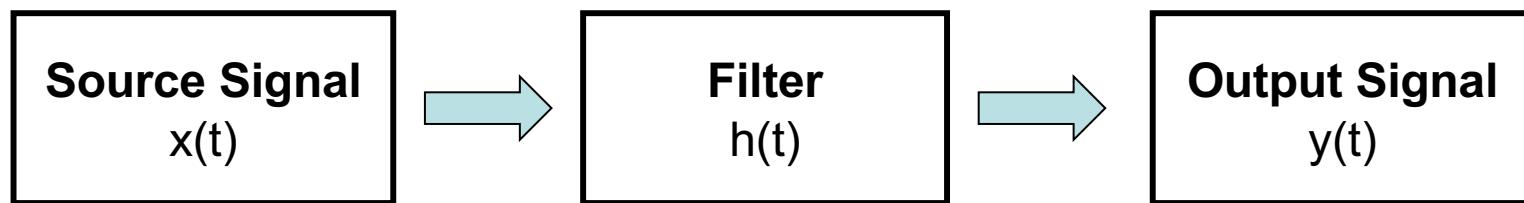


- Filters spaced equally in the log of the frequency.
- Mels are (more or less) related to frequency by...

$$f_{mel} = 2595 \log_{10} \left(\frac{f}{700} + 1 \right)$$

- Edge of each filter = center frequency of adjacent filter
- Typically, 40 filters are used

Source-Filter Model



$$x(t) * h(t) = y(t)$$

↑
Convolution

The equation $x(t) * h(t) = y(t)$ represents the convolution of the source signal $x(t)$ with the filter $h(t)$ to produce the output signal $y(t)$. A vertical arrow labeled "Convolution" points upwards from the asterisk (*) symbol in the equation.

The Cepstrum

- Filtering is
 - Convolution in the time domain
 - A product in the frequency domain
- What if we want to make it an addition operation?

$$Y[k] = X[k] \cdot H[k]$$

$$|Y[k]| = |X[k]| \cdot |H[k]|$$

$$\log(|Y[k]|) = \log(|X[k]|) + \log(|H[k]|)$$

The Cepstrum

- Filtering is
 - Convolution in the time domain
 - A product in the frequency domain
 - What if we want to make it an addition operation?
 - They do this by defining the **cepstrum**.

$$Cep_x(q) = Z^{-1}(\log |X(z)|)$$

↑ ↑ ↑

A frequency representation

Quefrency The Inverse Z transform
(general case of the Inverse
Discrete Fourier Transform)

What is the Cepstrum for?

- Invented for finding echoes (aftershocks) in seismograph data.
- If something is useful for finding echoes, it is useful for finding impulse response functions
- ...which makes it useful for finding filter coefficients.

Let's look at an example...

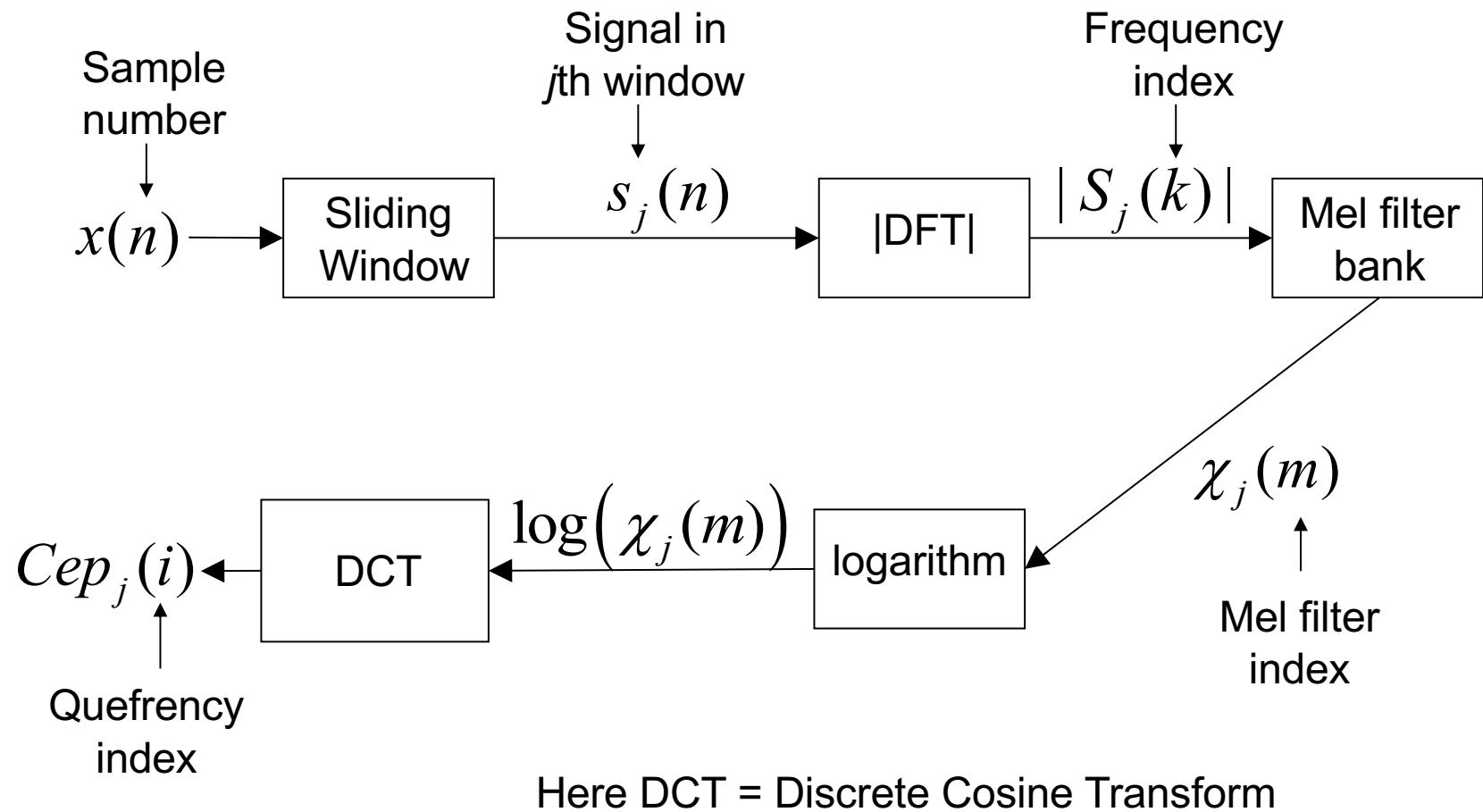
Some terms

- Spectrum
- Spectrogram
- Frequency
- Filtering
- Cepstrum
- Cepstrogram
- Quefrency
- Liftering

The Cepstrum

- Gives information about rate of change in the different quefrency bands.
- Popular representation for speech and music
- Distinguishing FILTER from the SIGNAL
 - Some quefrequencies represent the filter (what instrument), others represent the signal (what pitch)
- For these applications, the spectrum is usually first transformed to Mel Frequency bands.
- Result: **Mel Frequency Cepstral Coefficients (MFCC)**

Making a Mel Freq Cepstrogram



Let's have a look!

- (Go to bassoon/tuba demo)

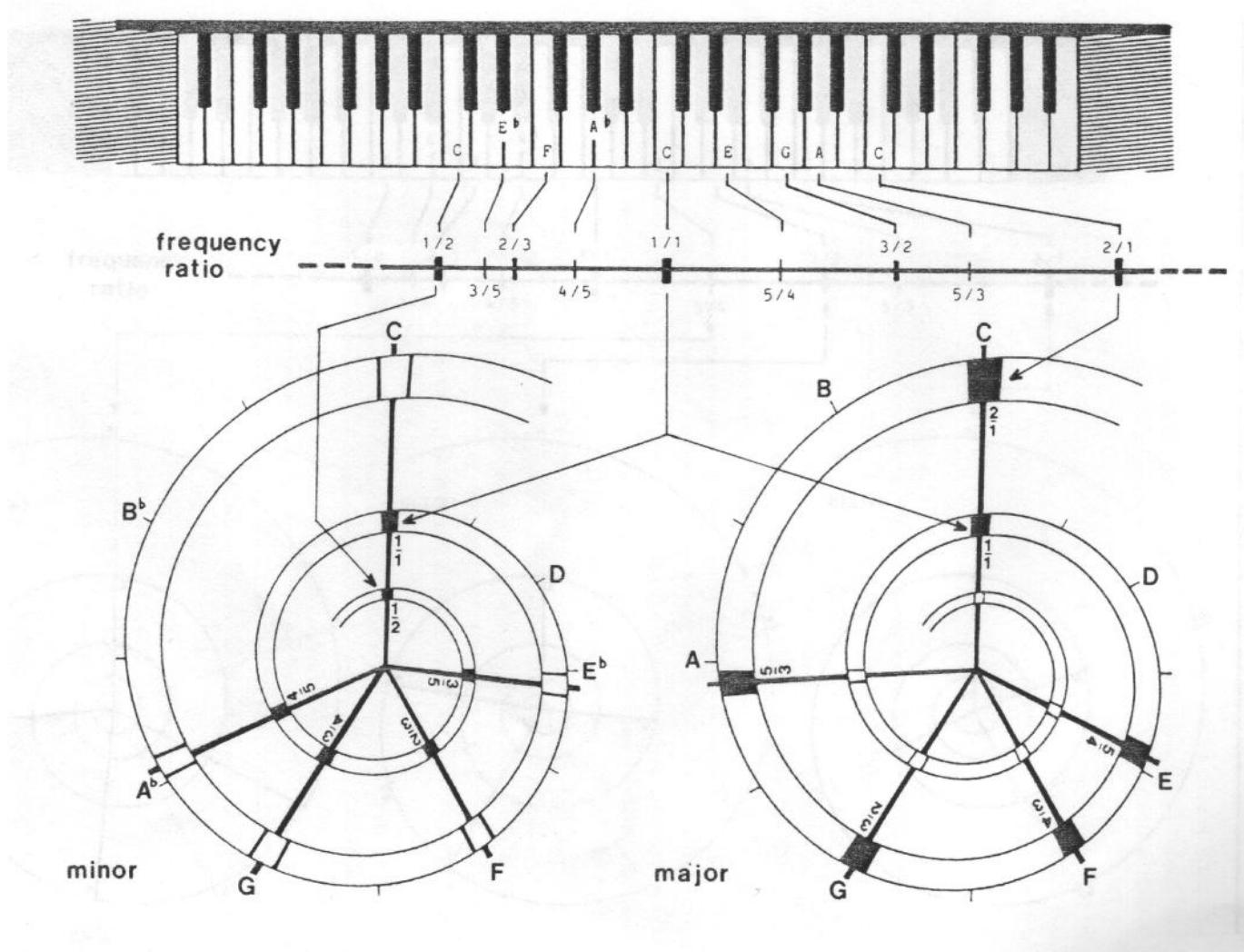
Equal Temperament

- Octave is a relationship by power of 2.
 - There are 12 half-steps in an octave

frequency of
desired pitch

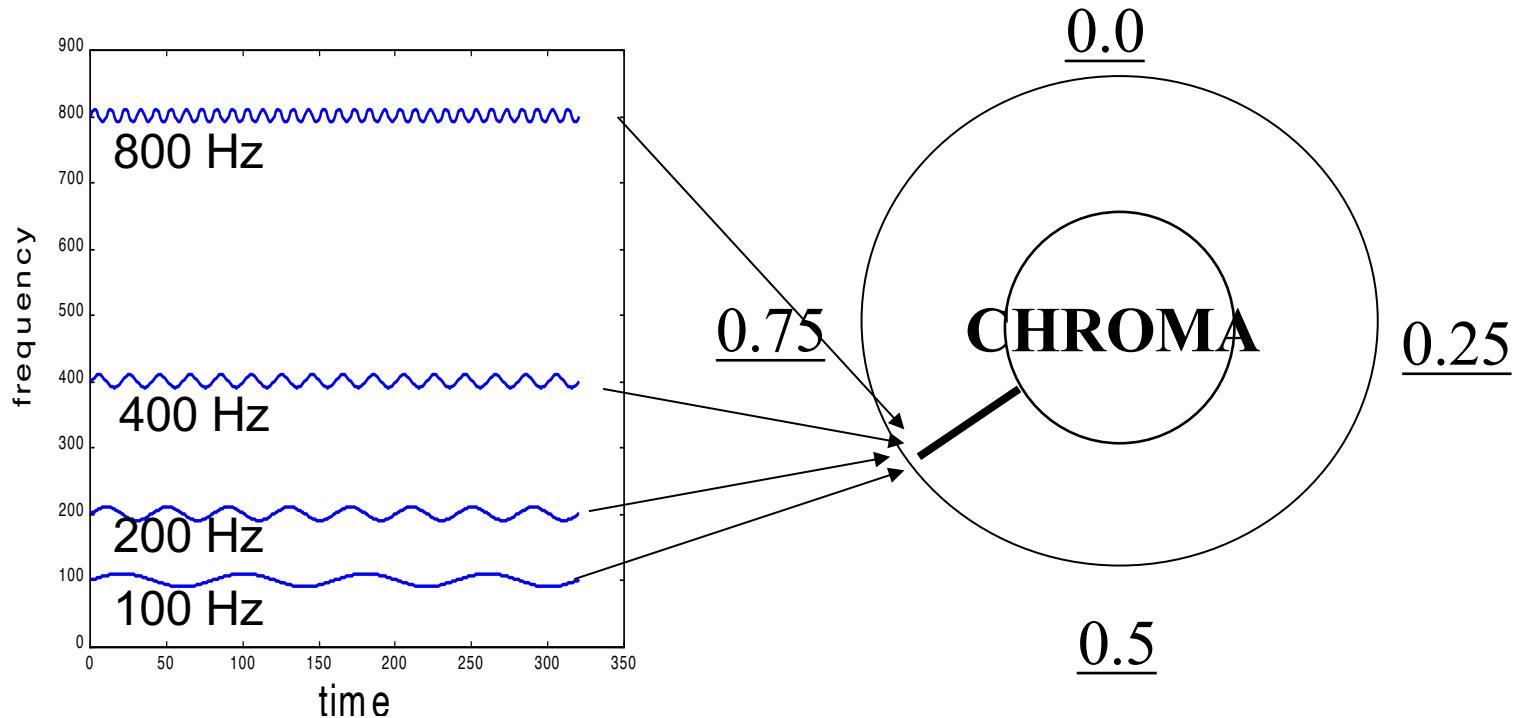
$$f = 2^{\frac{n}{12}} f_{ref}$$

Spiral Pitch representation



Chroma: Many to one

- Chroma = $\log_2(\text{freq}) - \text{floor}(\log_2(\text{freq}))$
- Chroma periodic in range 0 to (almost) 1
- Chroma map on to pitch classes

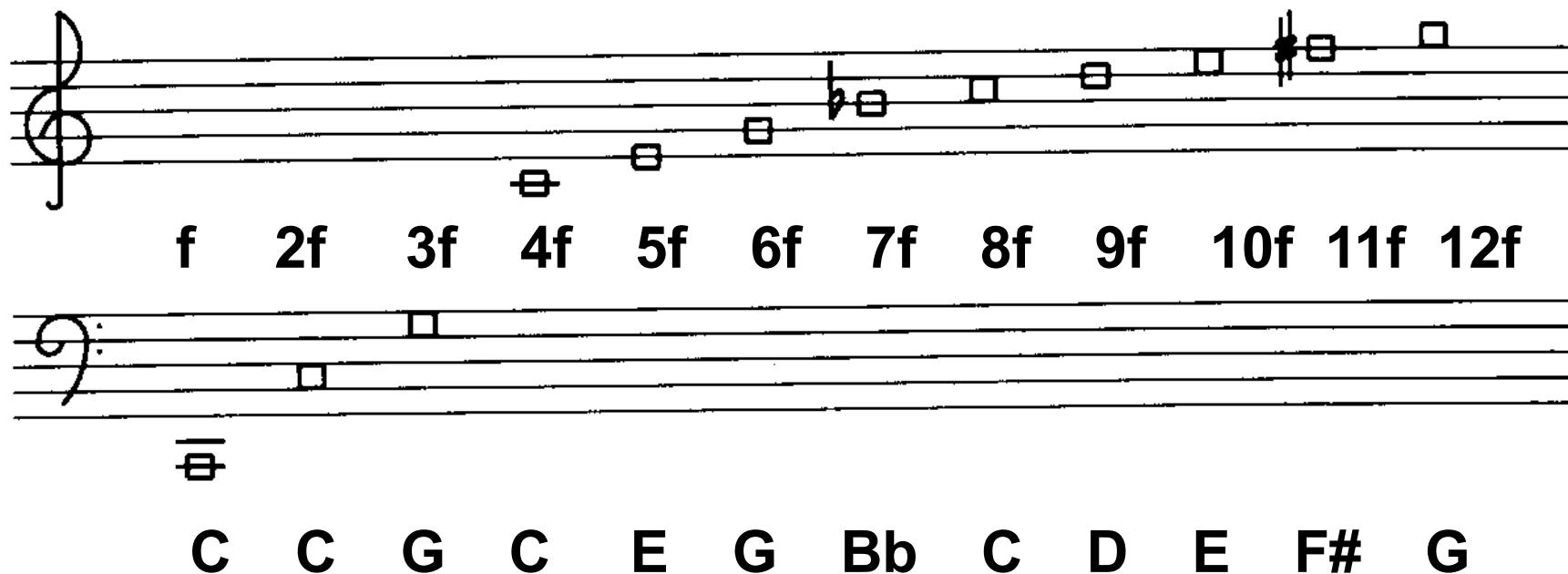


Making a Chromagram

- Decide how to quantize (bin) the chroma range.
 - 12 pitch classes? 120 bins? Equal temperament?
- Make a spectrogram
- For each time-step in the spectrogram
 - find the chroma for each frequency from 0 to $N/2$
 - Sum the amplitude of all frequencies with the same chroma bin
 - (Some chromagrams also add in the energy from the odd harmonics)
 - Place that value in the chroma bin

Overtone Series

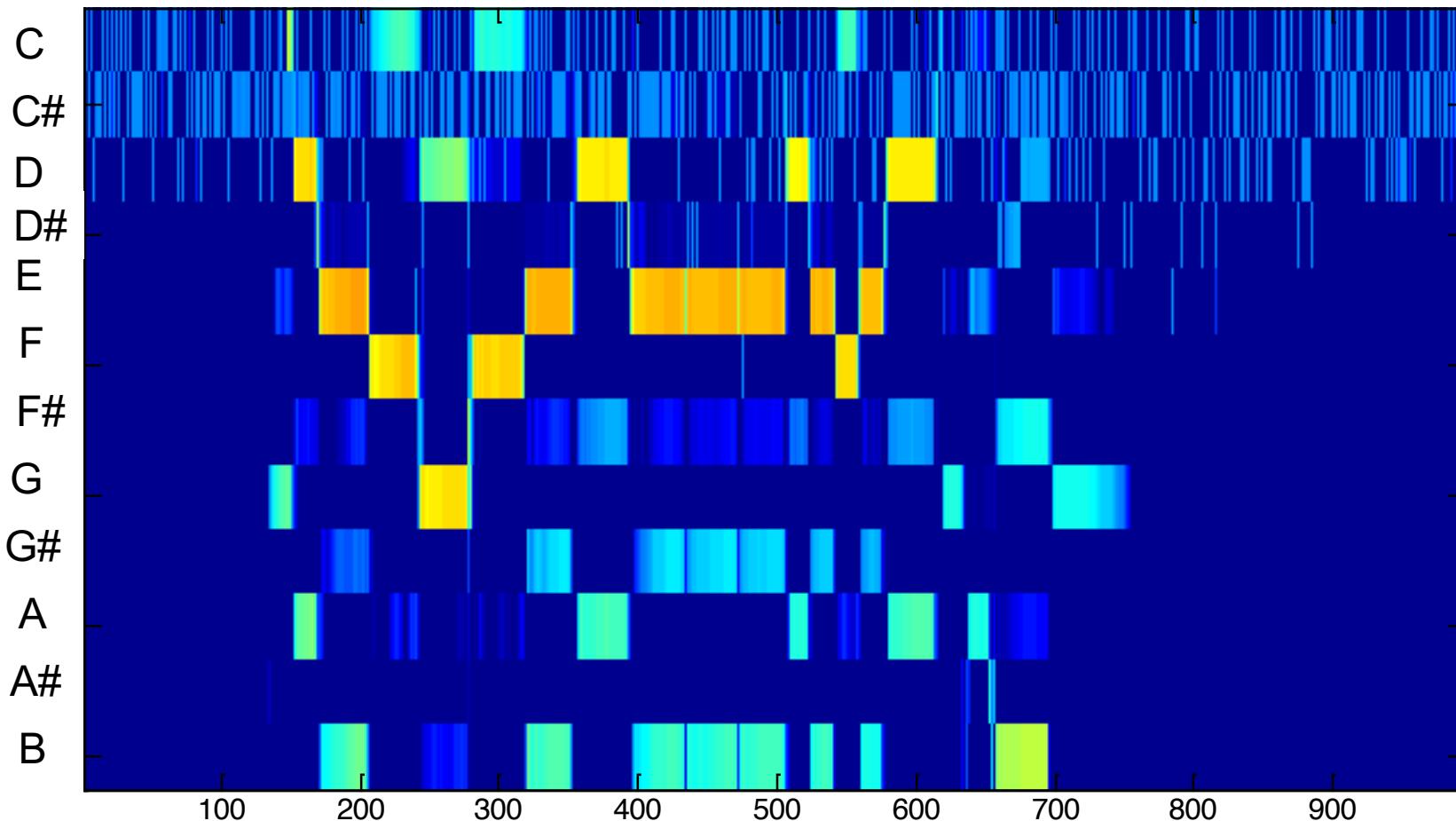
- Approximate notated pitch for the harmonics (overtones) of a frequency



A fancier chromagram

- For complex sounds (like the bassoon example from class) you might want to consider adding up energy from more harmonics than just the octaves (1f, 2f, 4f...etc).
- Try taking the energy from the 3rd, 5th and 7th harmonics as well.

Chromagram of Clarinet



Chromagram of Clarinet

