

# **CEPSTRUM**

**also for**

**RHYTHM-**

**detection**

**Tor Halmrast**

**Composer**

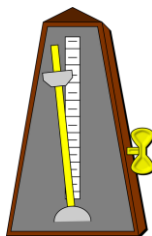
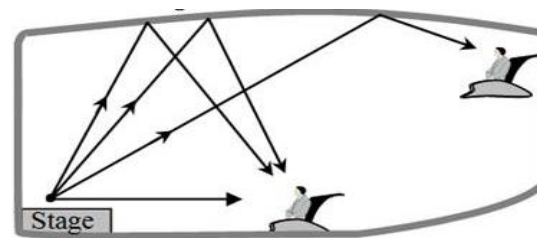
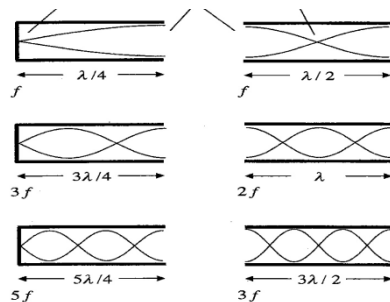
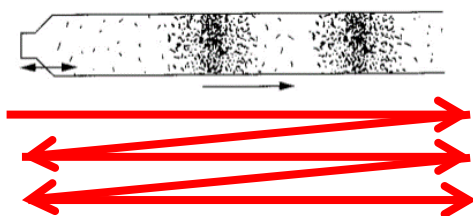
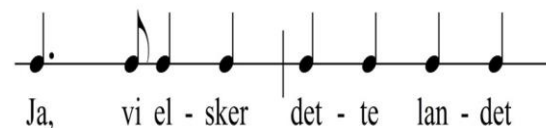
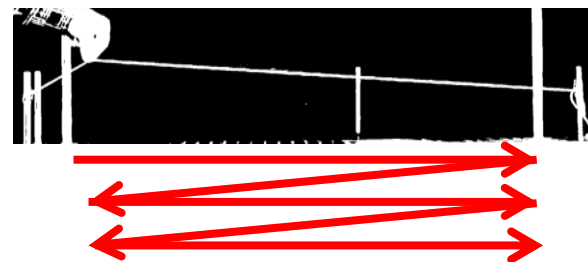
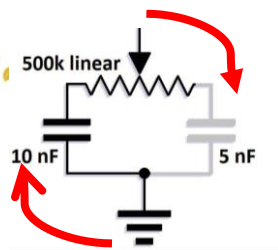
**Acoustician**

**Head of Acoustics, Statsbygg**

**Assoc. Prof., Univ. Oslo/Musicology**

**Norwegian Ac. of Music**

# TIMBRE, RYTHM, ECHO = REFLECTIONS (delays)



# EVERYTHING IS THE SAME!!!

## IMPULSE + REFLECTIONS

- Echoes

- Musical instruments

(flute = reflection+feed back)

-Timbre

(changes when adding a (short) reflection)

- Flutter Echoes

(PS! A bit more complicated)

- Rhythm

«EVERYTHING»

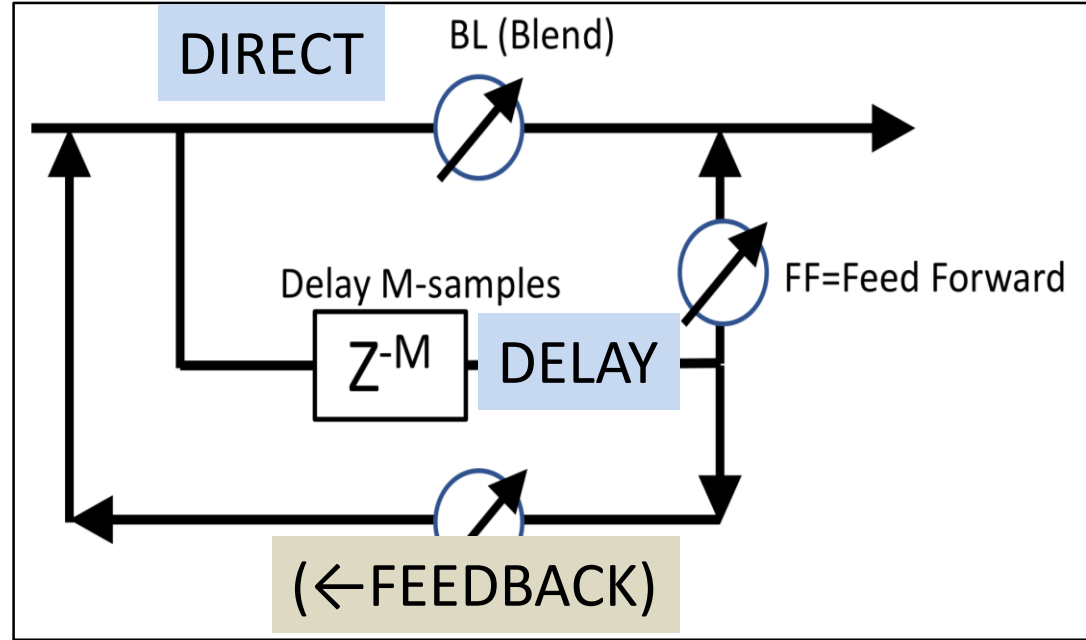
YOU CAN SEND A SIGNAL THROUGH

IS A **FILTER**

# The FILTER that describes it all !!

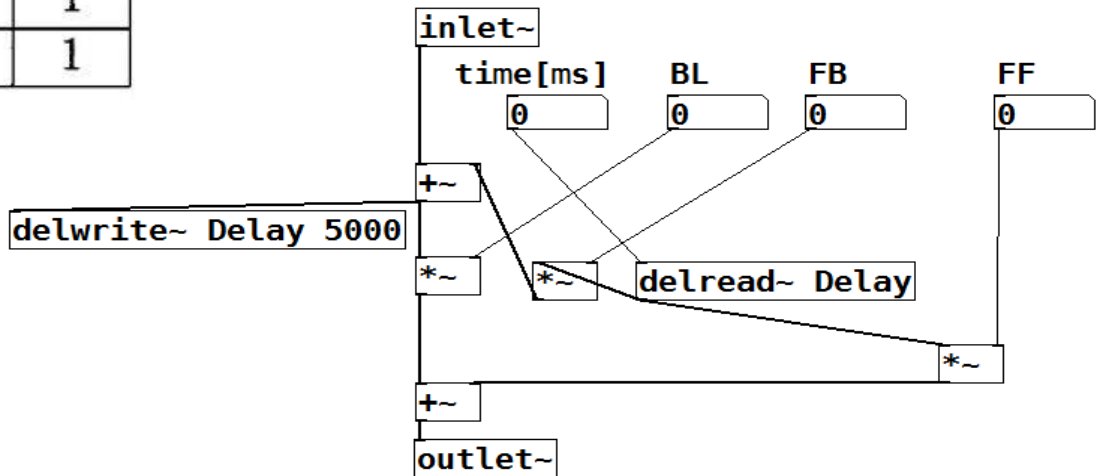
## DELAY

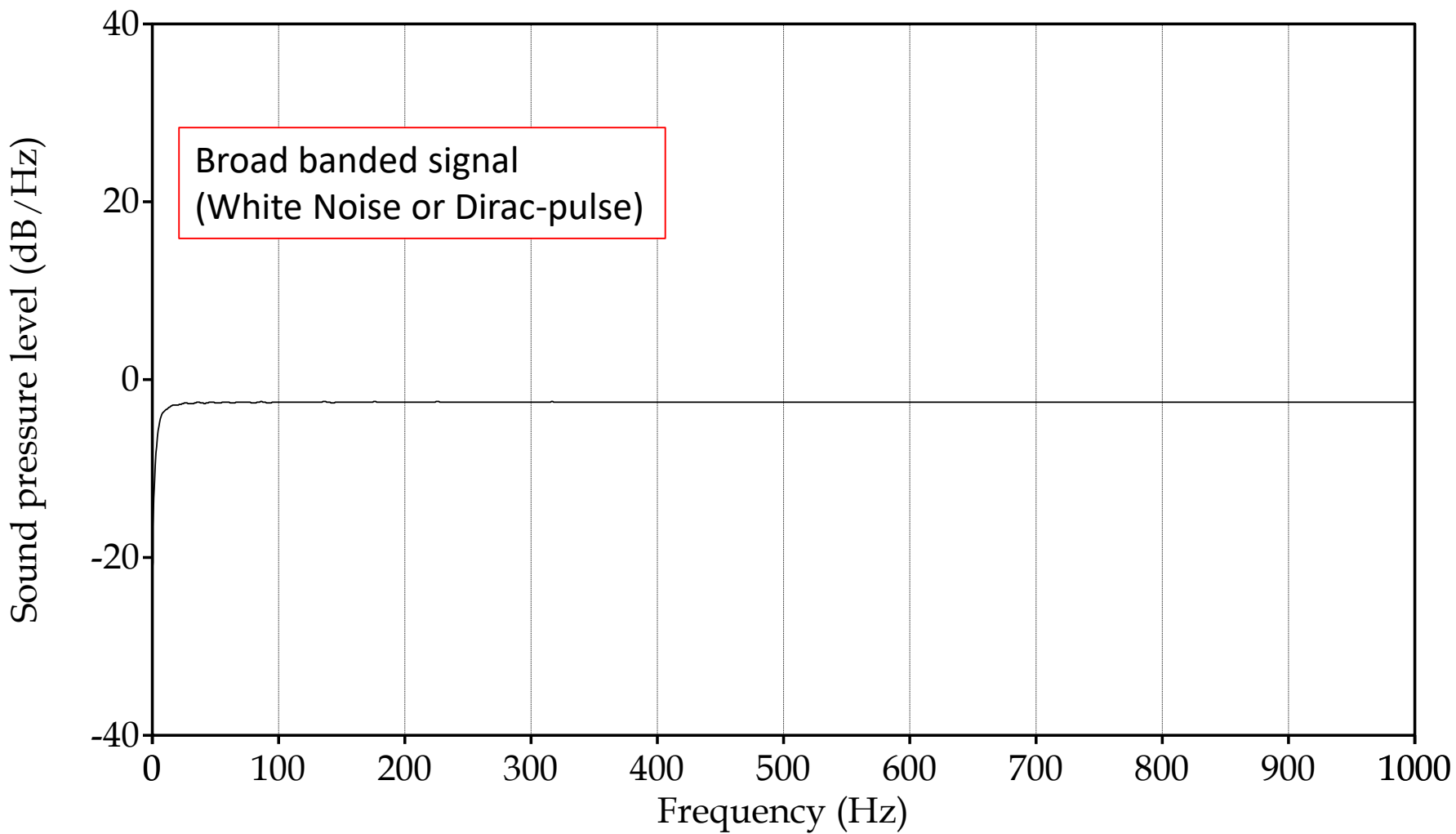
(+/- Feed back(



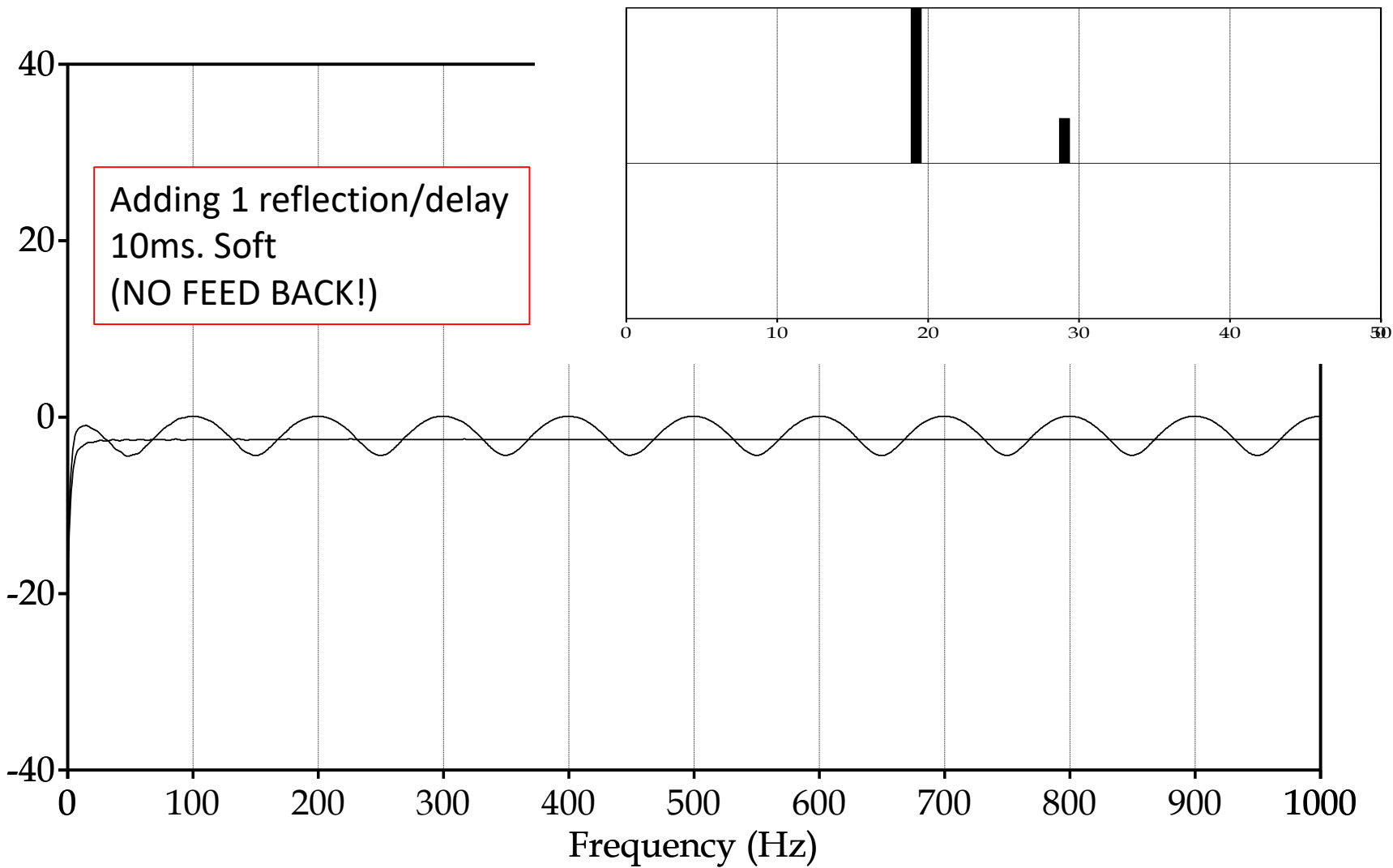
	BL	FB	FF
FIR comb filter	X	0	X
IIR comb filter	1	X	0
allpass	$a$	$-a$	1
delay	0	0	1

TTT: Timbre Takes Time

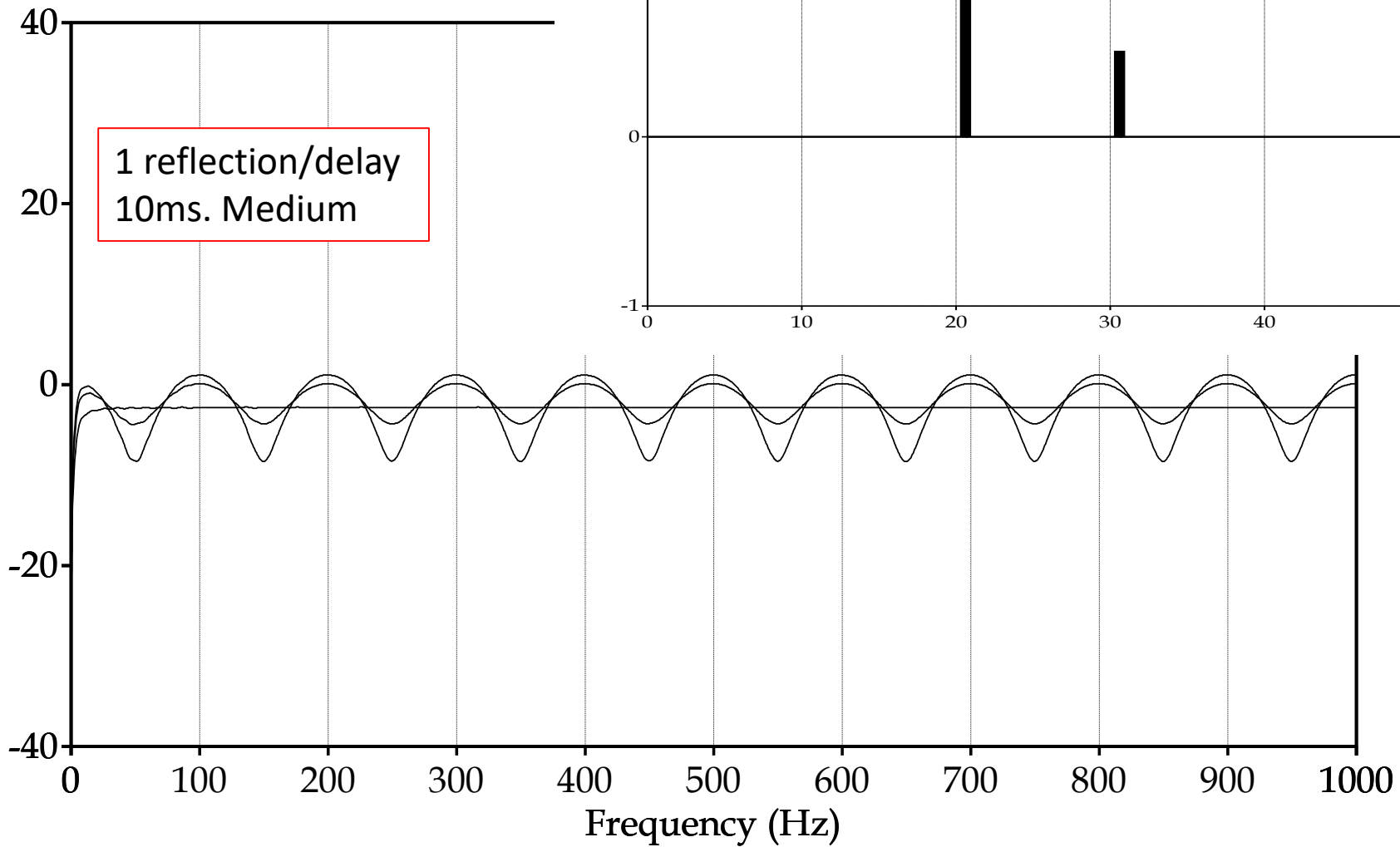




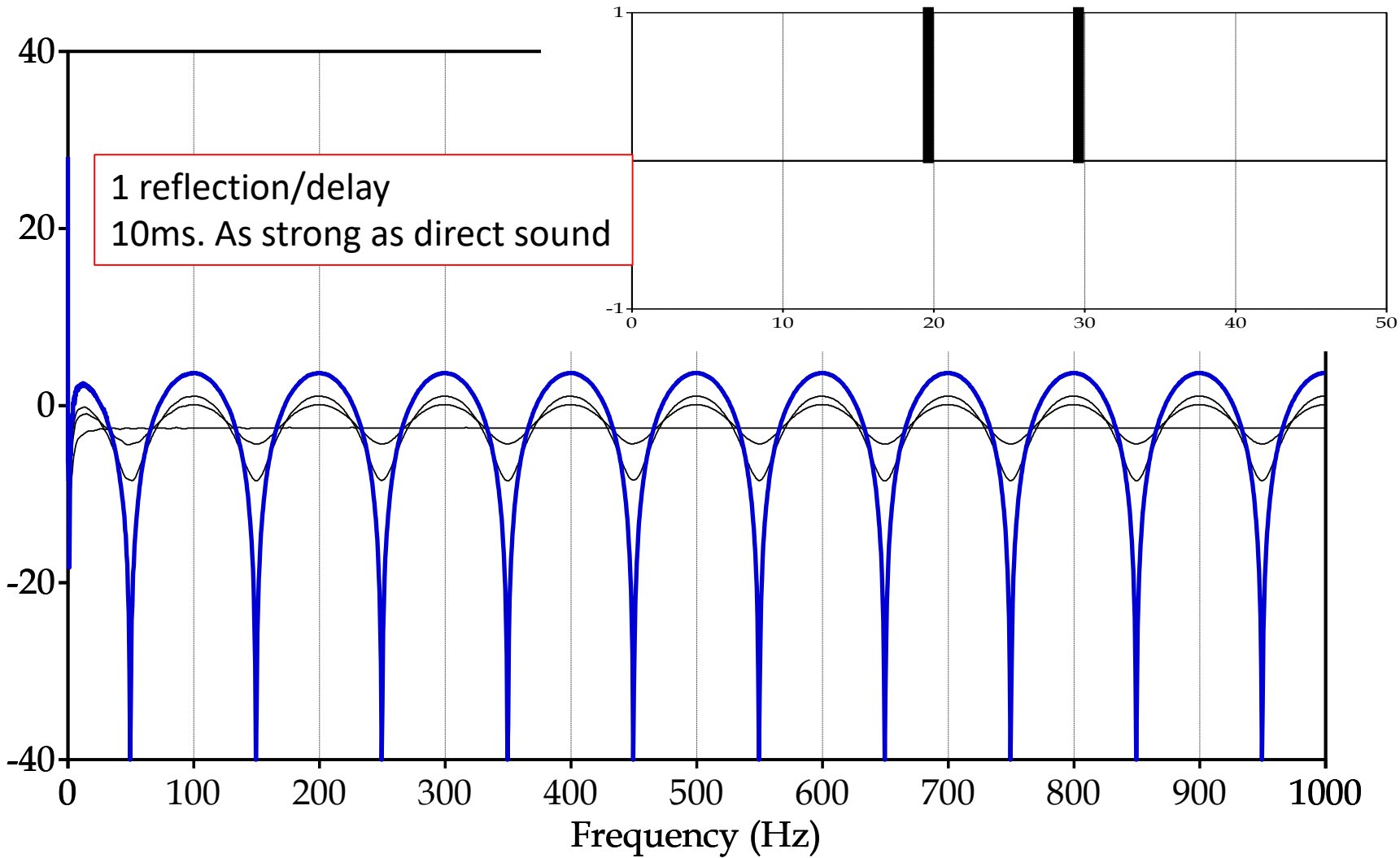
Sound pressure level (dB/Hz)



Sound pressure level (dB/Hz)



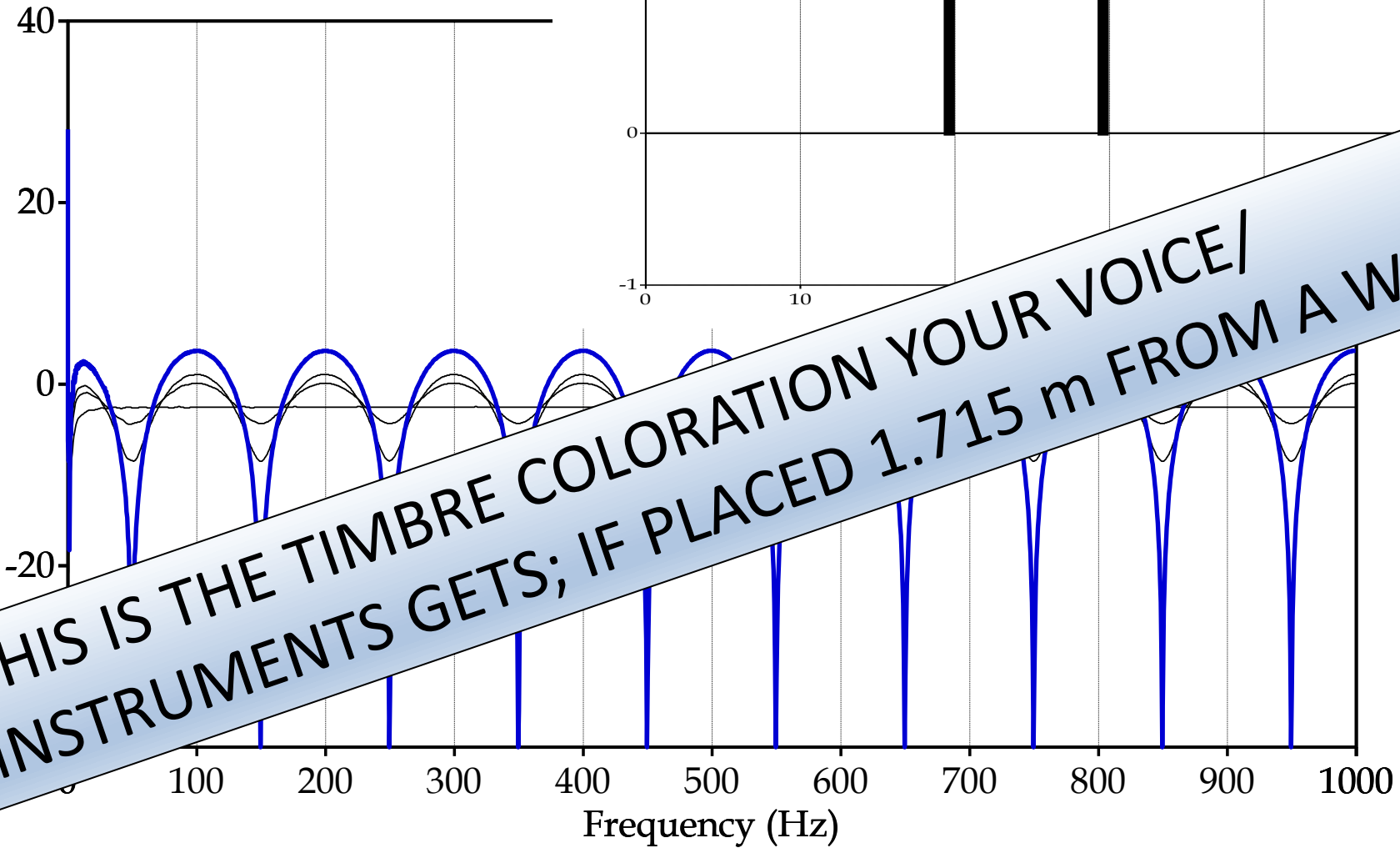
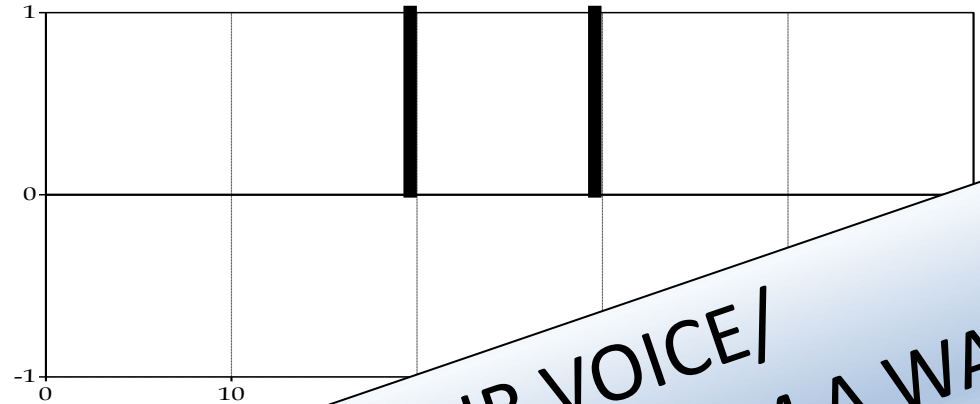
Sound pressure level (dB/Hz)



**COMB-FILTER**



Sound pressure level (dB/Hz)

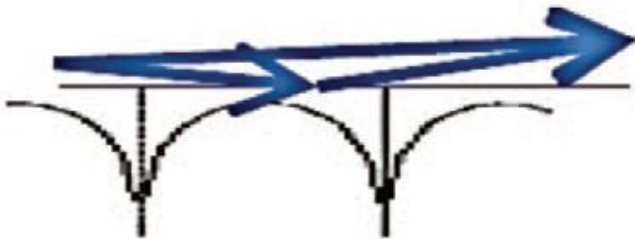


**THIS IS THE TIMBRE COLORATION YOUR VOICE/  
INSTRUMENTS GETS; IF PLACED 1.715 m FROM A WALL**

# COMB FILTERS

$$\text{CBTB} = \text{CombBetweenTeethBandwidth} = \frac{1}{\Delta t}$$

SHORT



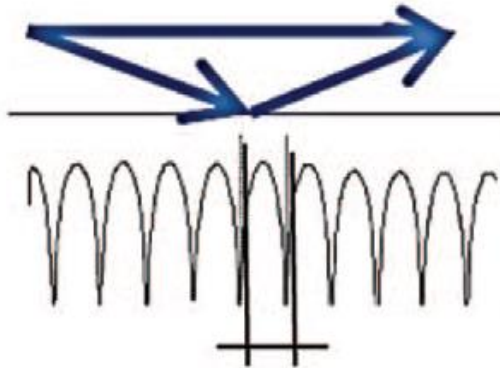
**DELAY:**

MEDIUM

(TIMBRE CHANGES)

$$\Delta t = 10 \text{ ms}$$

$$\Delta x = 2 \times 1,715 = 3,43 \text{ m}$$



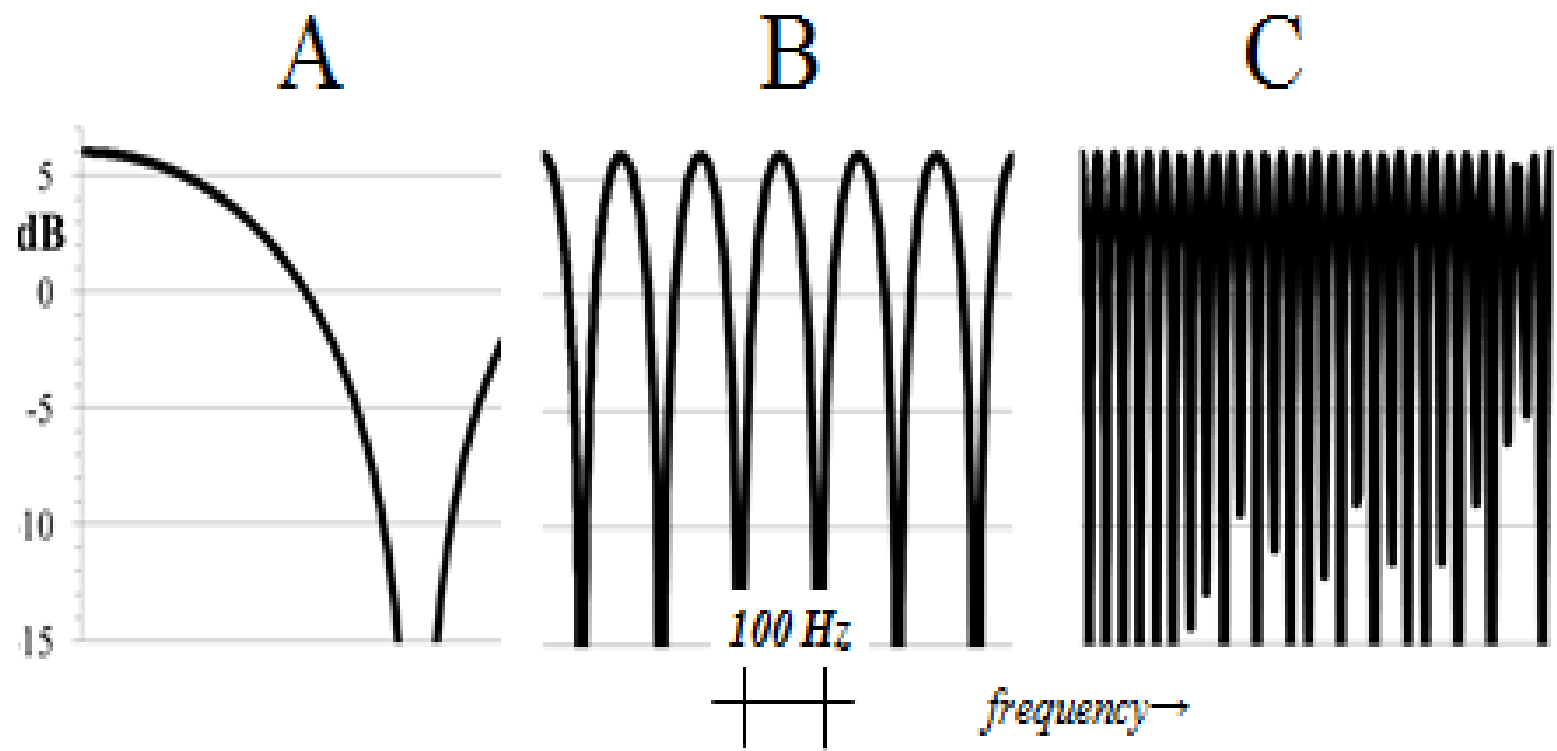
CBTB=100Hz

LONG

(ECHO in TIME DOMAIN)



PS! For 50 ms:  $\text{CBTB} = 1000/50 = 20 \text{ Hz}$



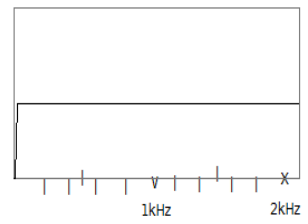
**2.5 ms (2 x 0.43 m)**  
**CBTB=400 Hz**

**10 ms (2 x 1.7 m)**  
**CBTB=100 Hz**

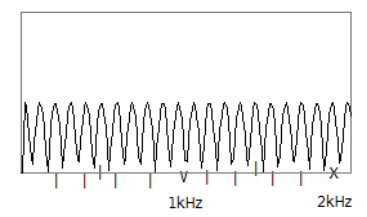
**1000 ms (2 x 34 m)**  
**CBTB=10 Hz**

# PERCEIVED «Pitch» of COMB FILTERS

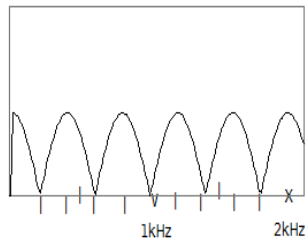
0 ms



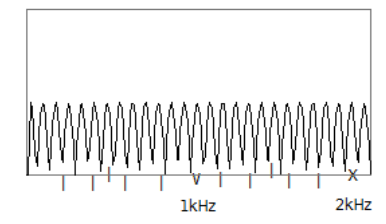
10ms CBTB=100Hz (2x 1,7m)



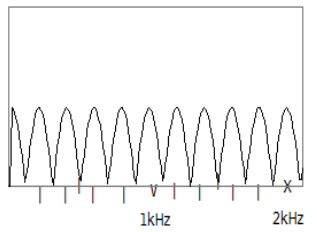
2,5ms CBTB=400Hz (2x0,43m)



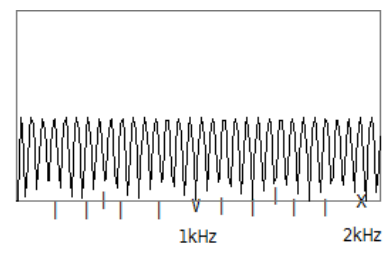
12,5ms CBTB=80Hz (2x2,14m)



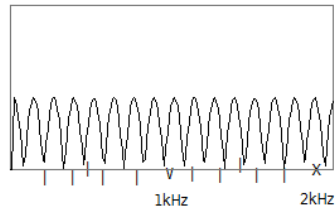
5 ms CBTB=200Hz (2x0,86m)



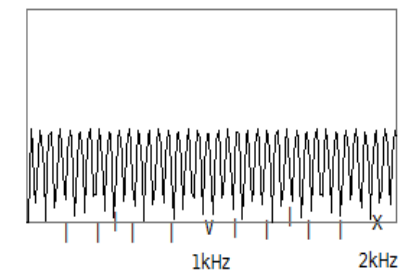
15 ms CBTB=66,7Hz (2x2,6m)



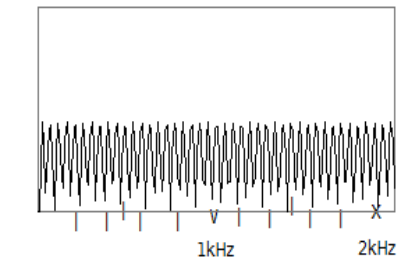
7,5 ms CBTB=137Hz (2x1,3m)



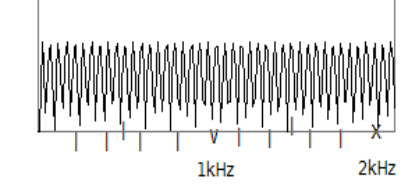
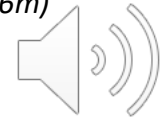
17,5ms CBTB=57Hz (2x3m)



20 ms CBTB=50 Hz (2x3,4m)

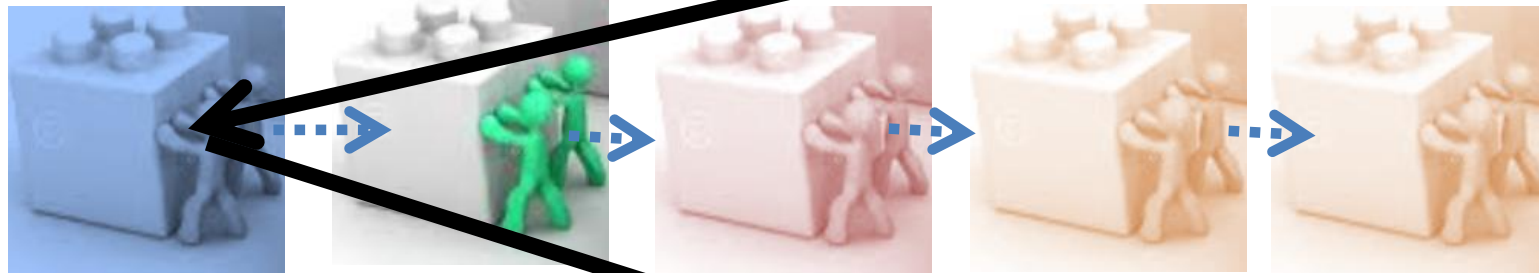


50 ms CBTB=20 Hz (2x8,6m)



Constant white noise  
approximation: Water fountain, Walking on gravel etc.

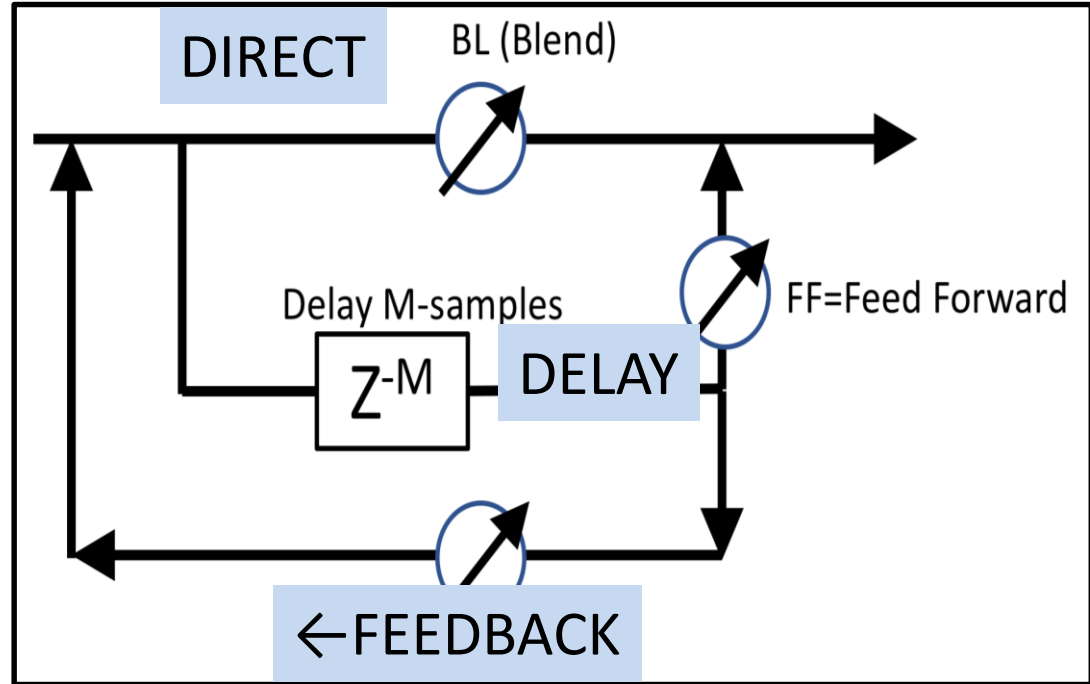
Composition made by abruptly moving a reflecting wall



The **R**ational Anthem of Norway



# DELAY +/- Feed back



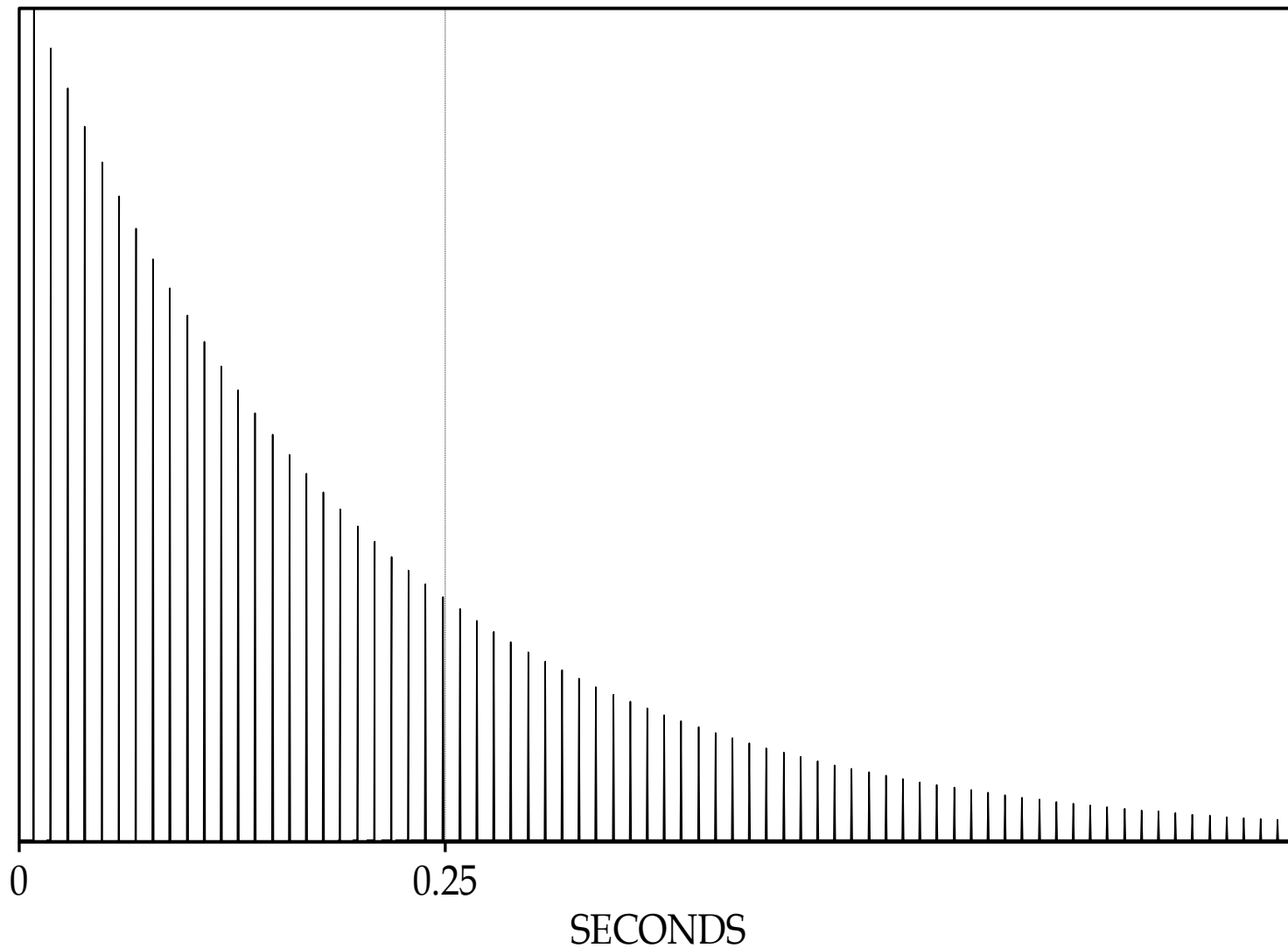
	BL	FB	FF
FIR comb filter	X	0	X
IIR comb filter	1	X	0
allpass	$a$	$-a$	1
delay	0	0	1

TTT: Timbre Takes Time

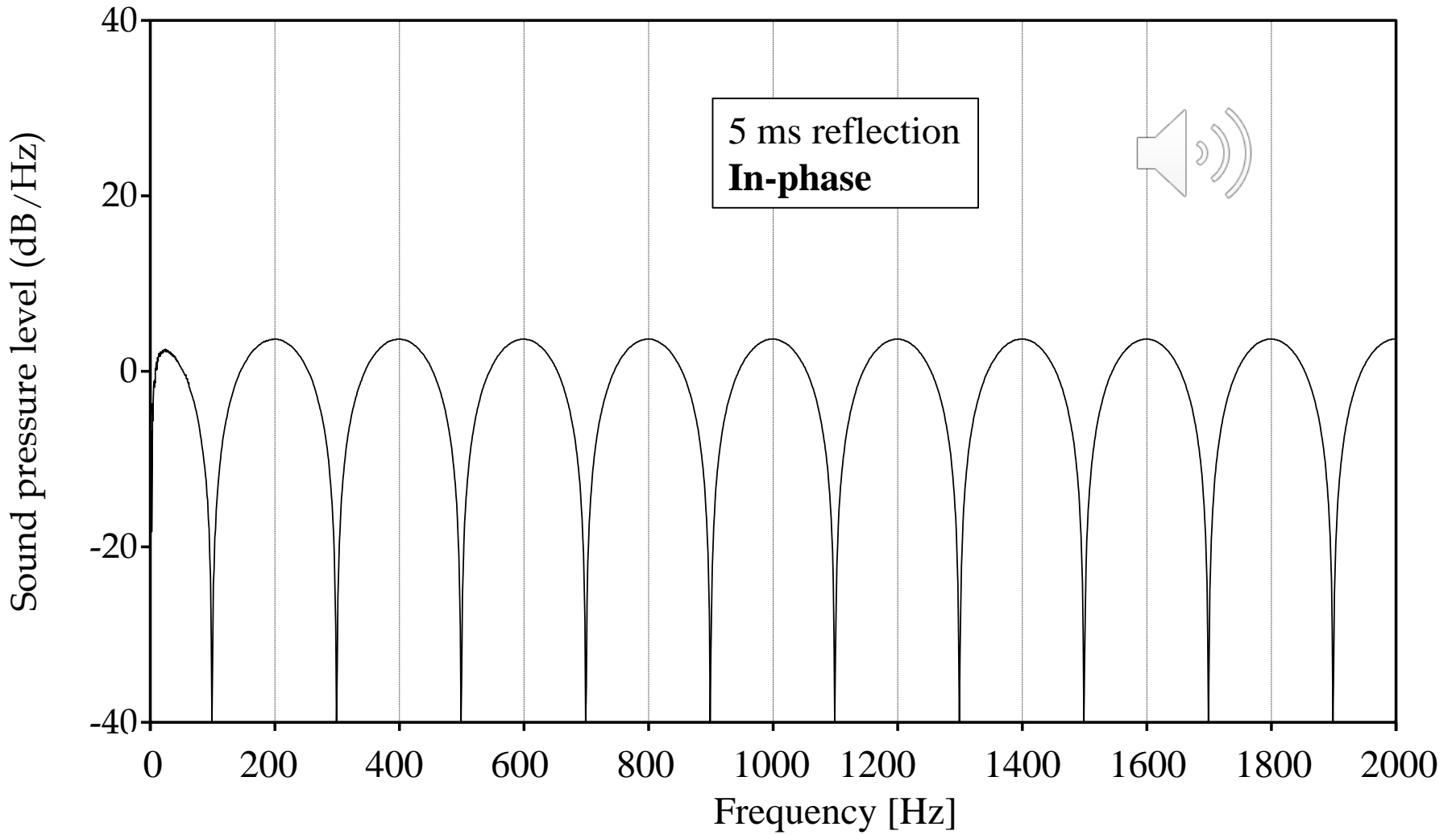
**WITH FEED BACK**  
**(in-phase)**

Feed-Back=0.95, FeedForward=0.05

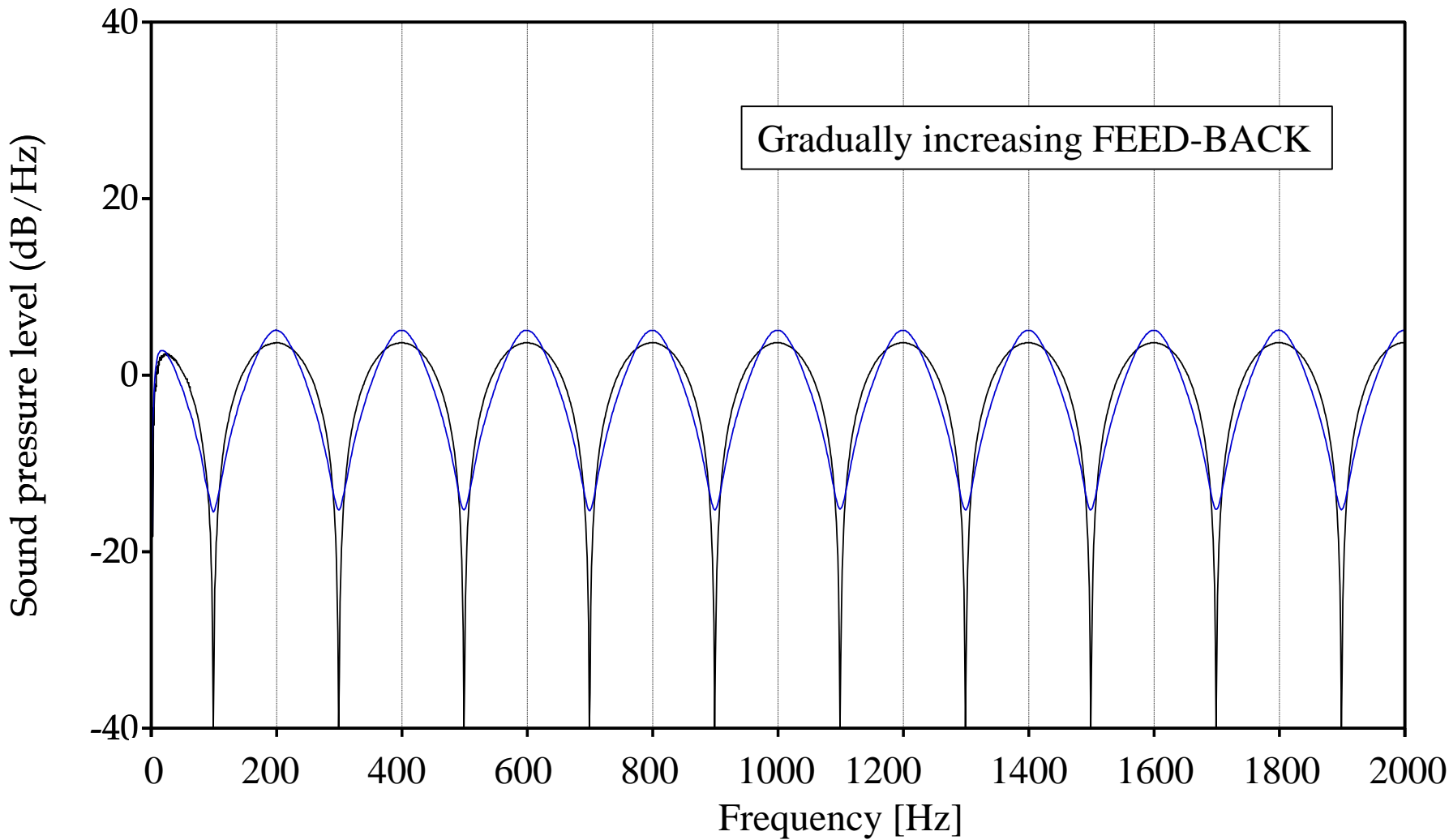
Signal:



# SPECTRUM

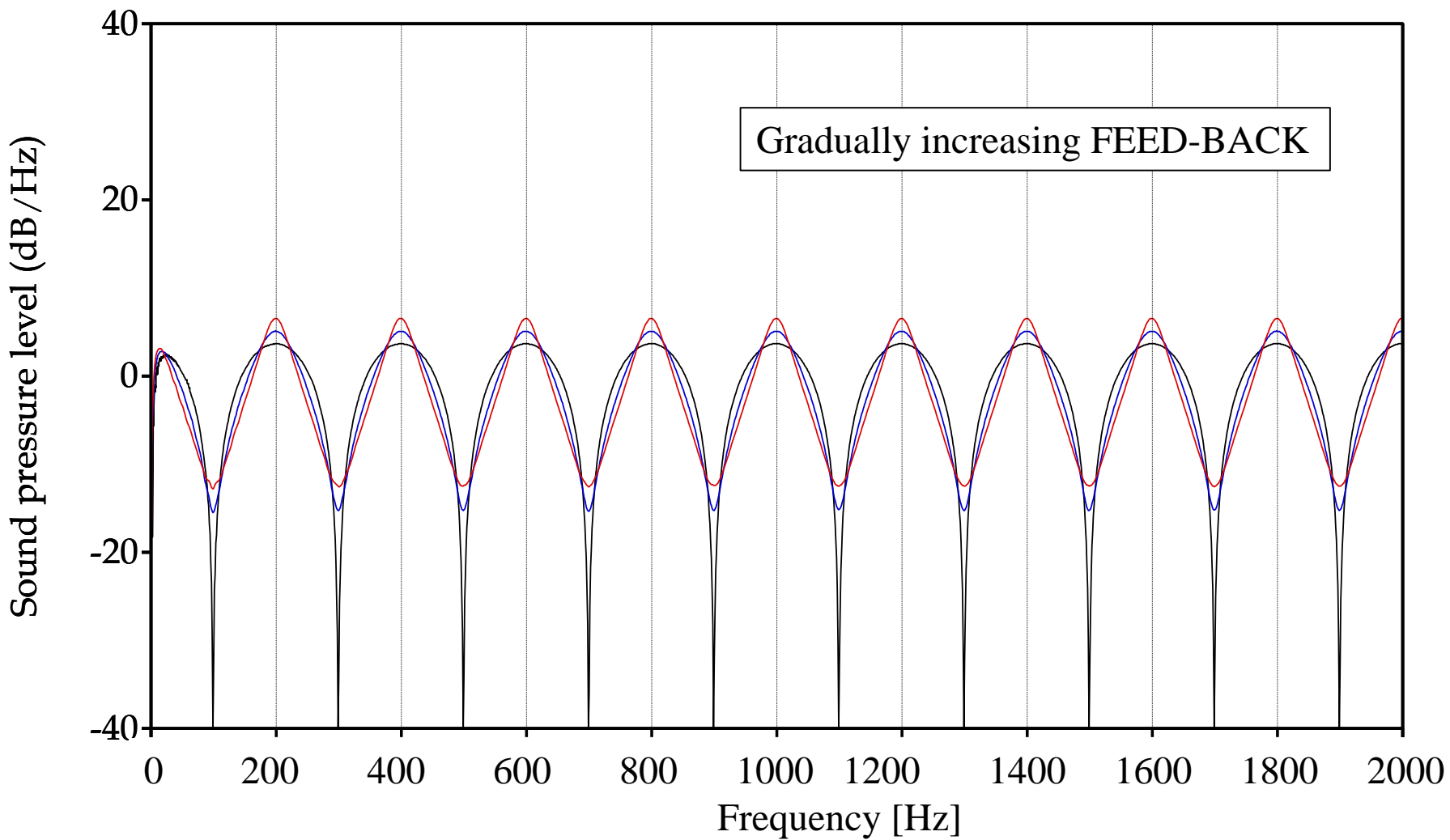


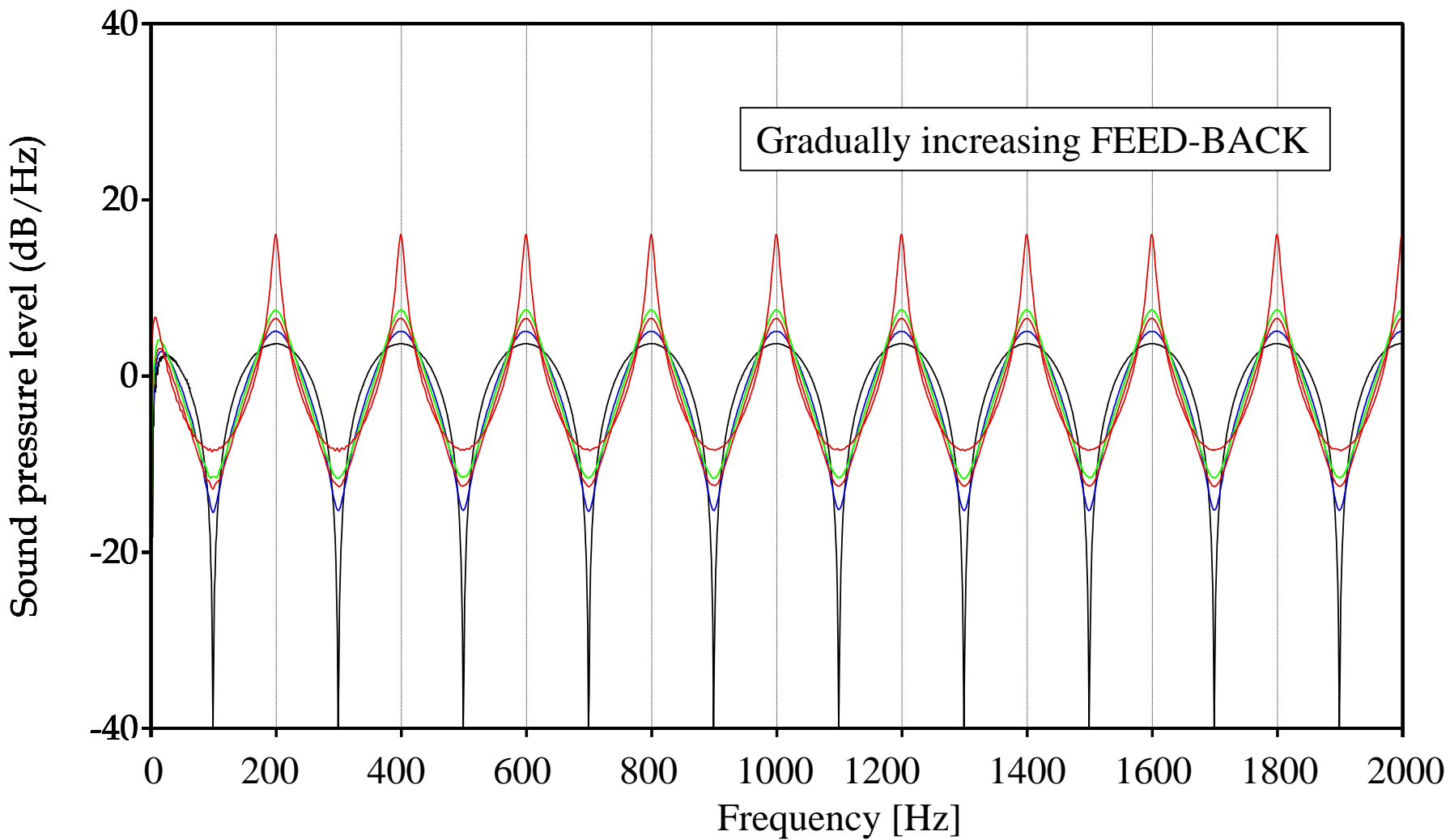




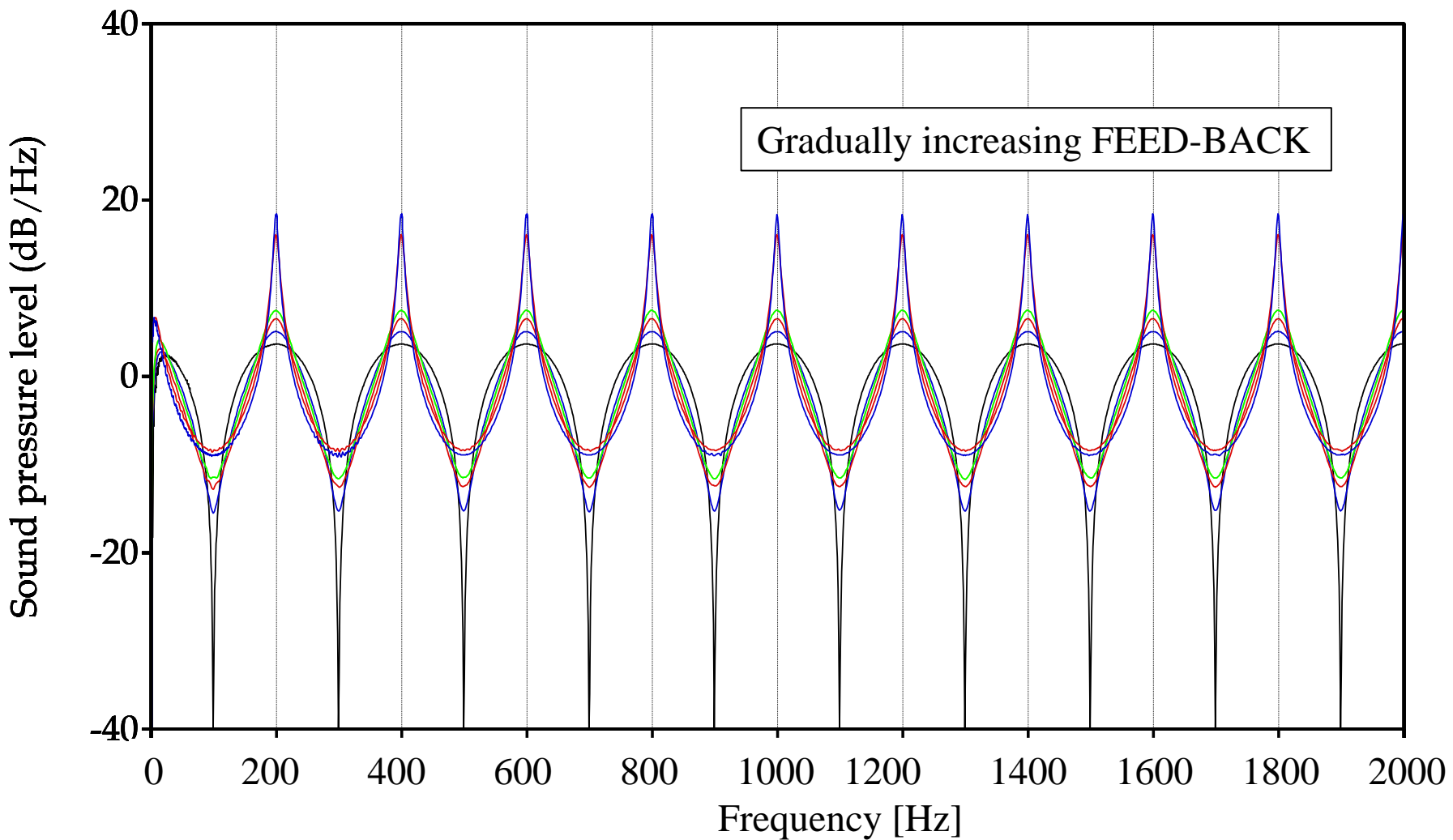
Signal:



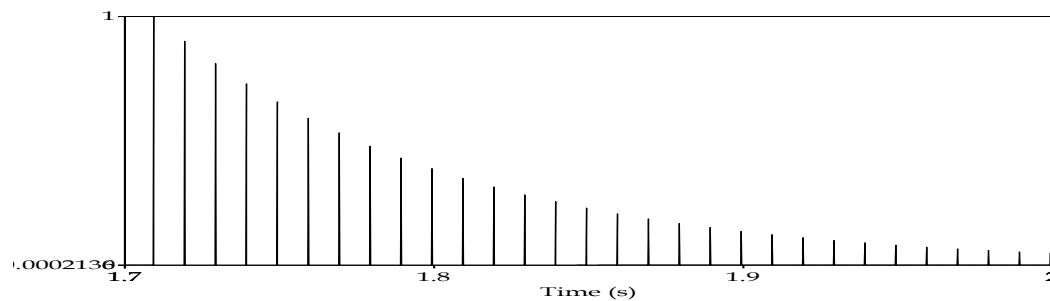


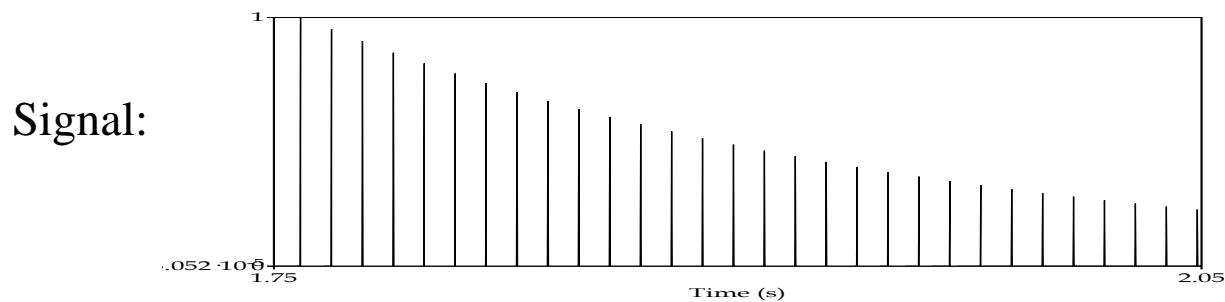
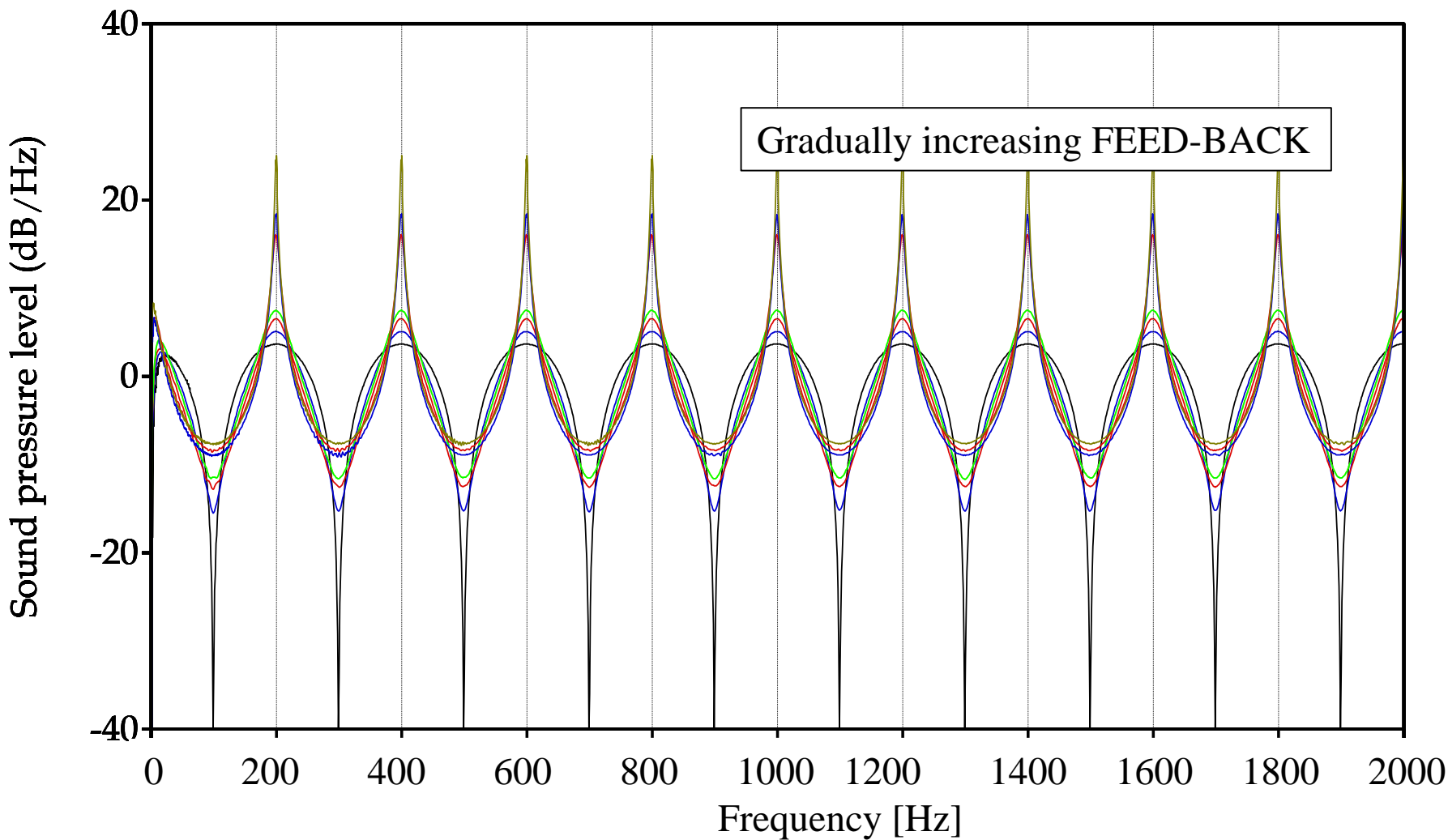


# SPECTRUM

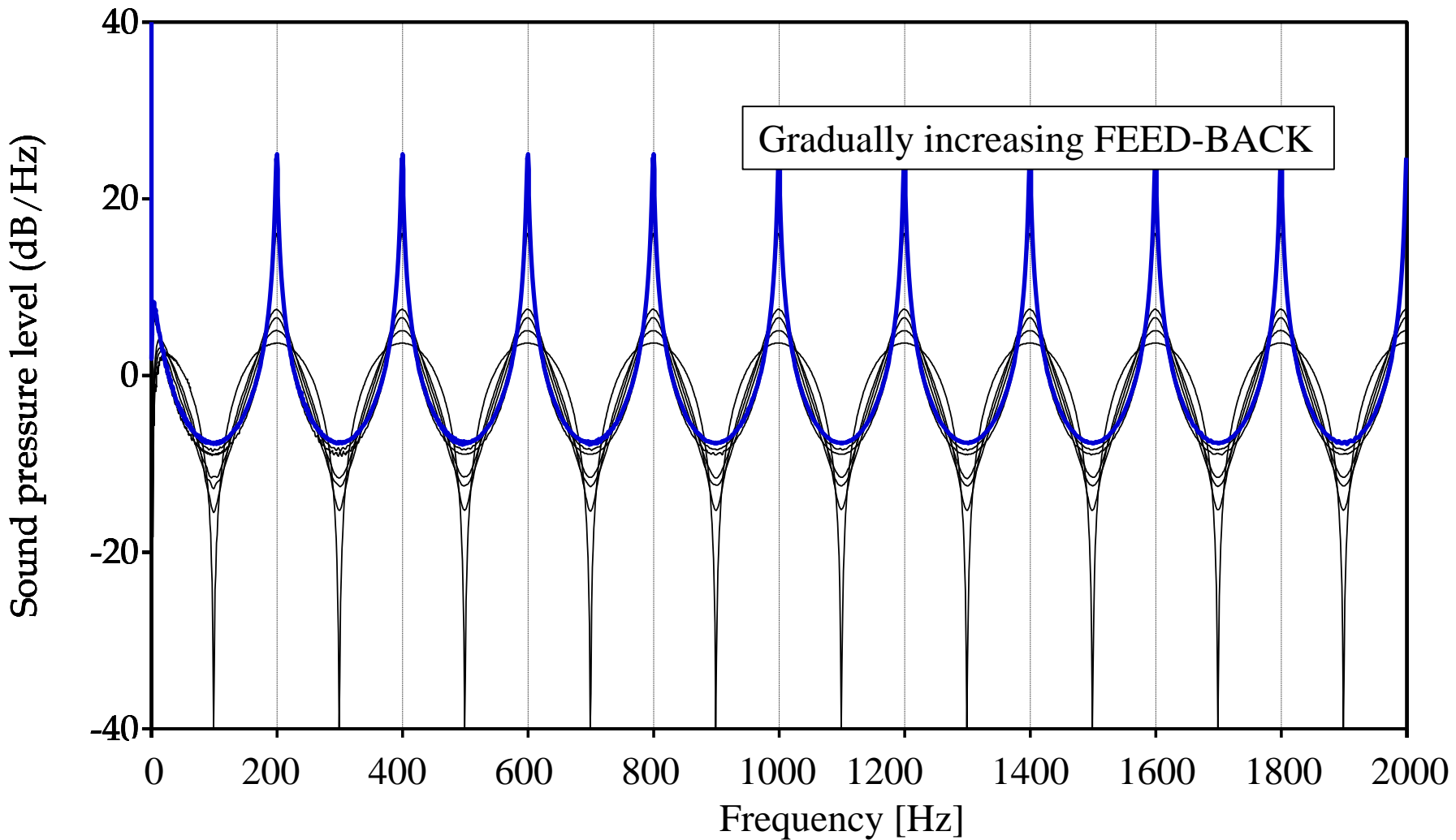


Signal:

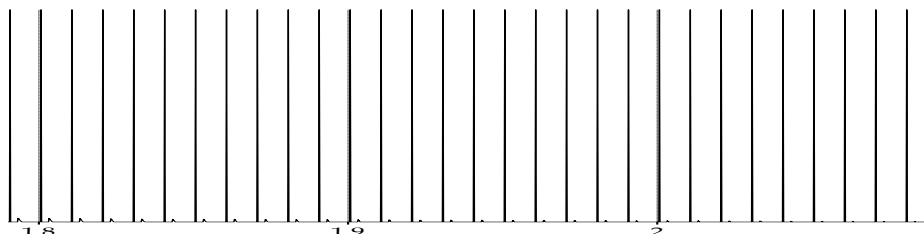




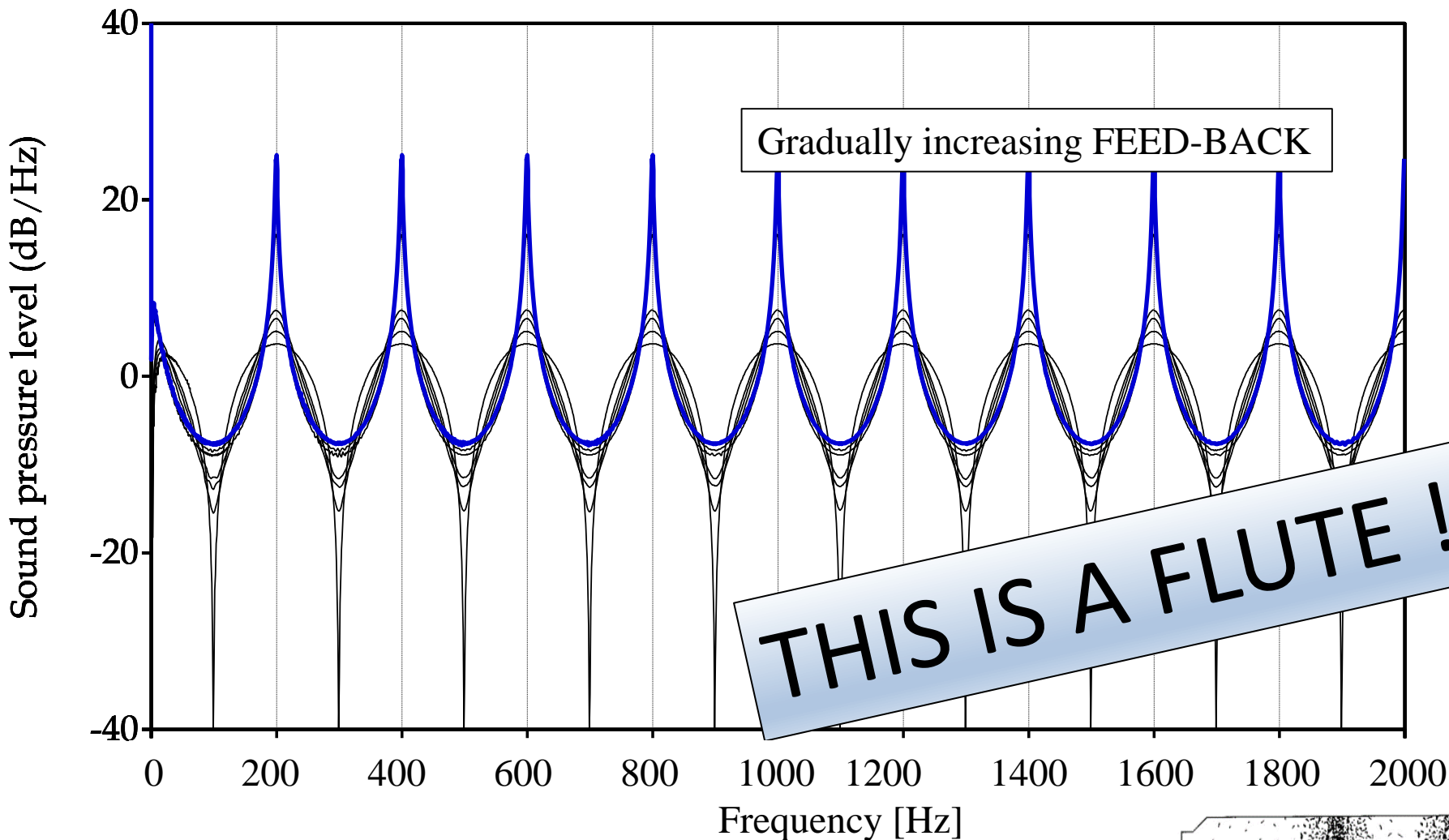
# SPECTRUM



Signal:

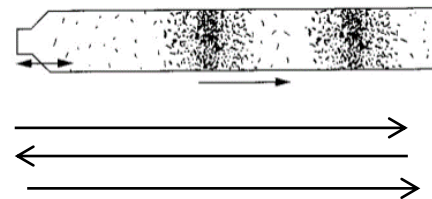
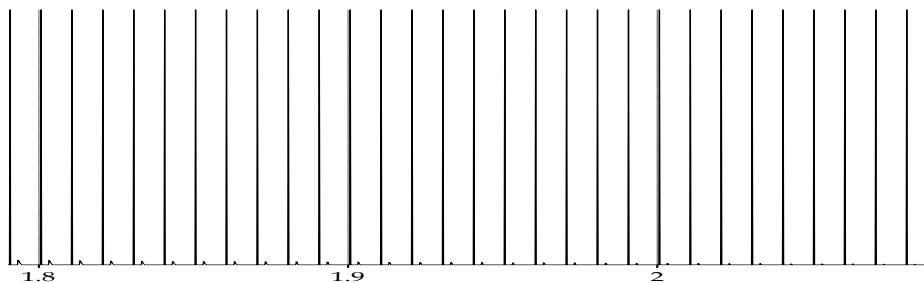


# SPECTRUM



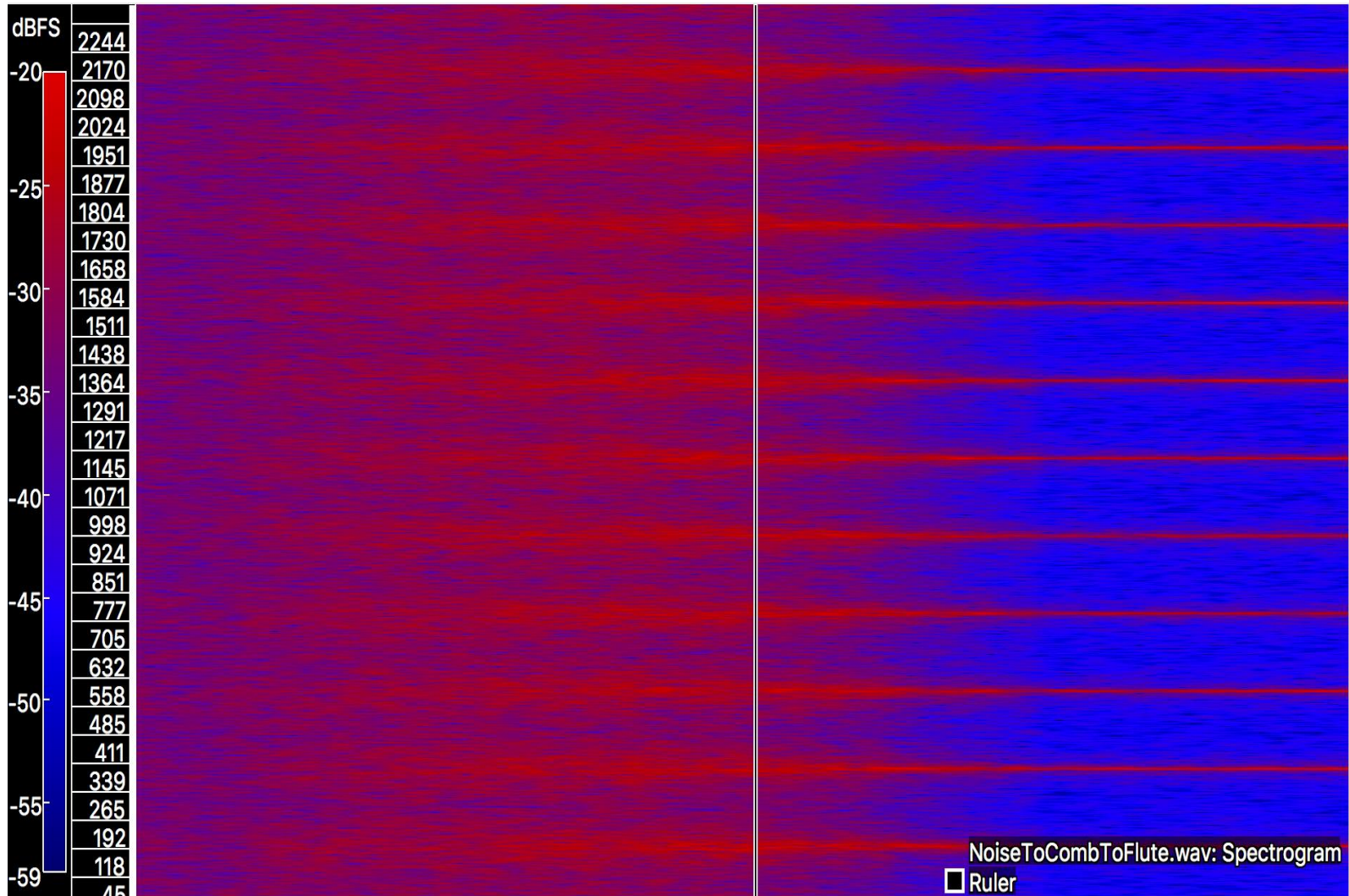
**THIS IS A FLUTE !**

Signal:



Freq [Hz]  
linear

# SPECTROGRAM

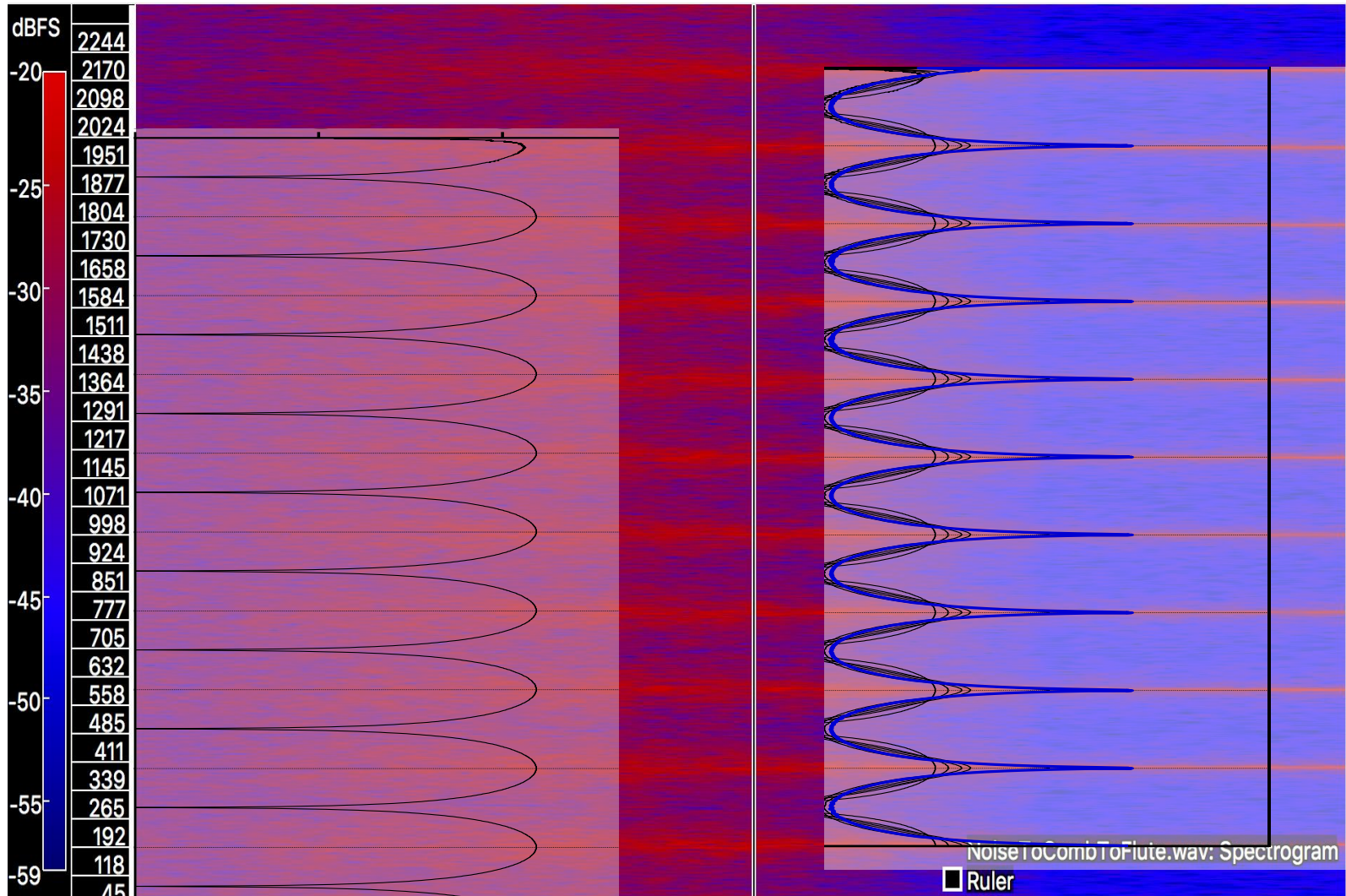


Time s

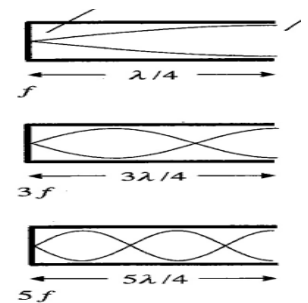
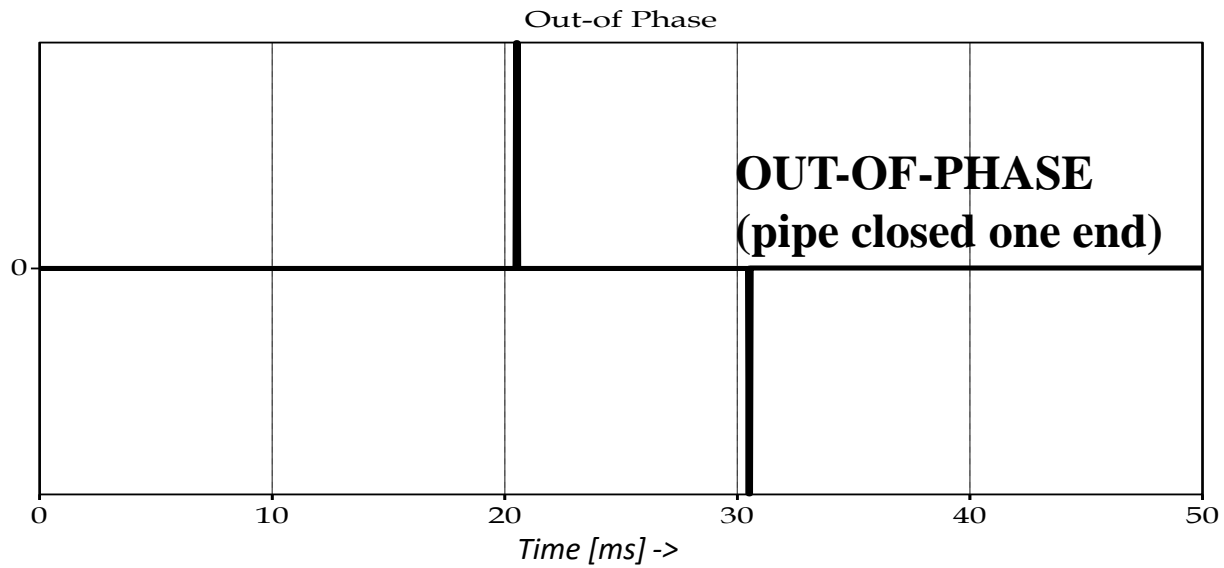
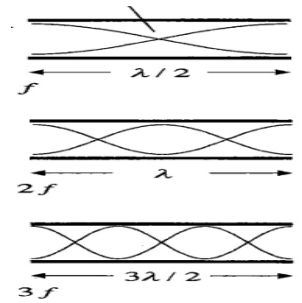
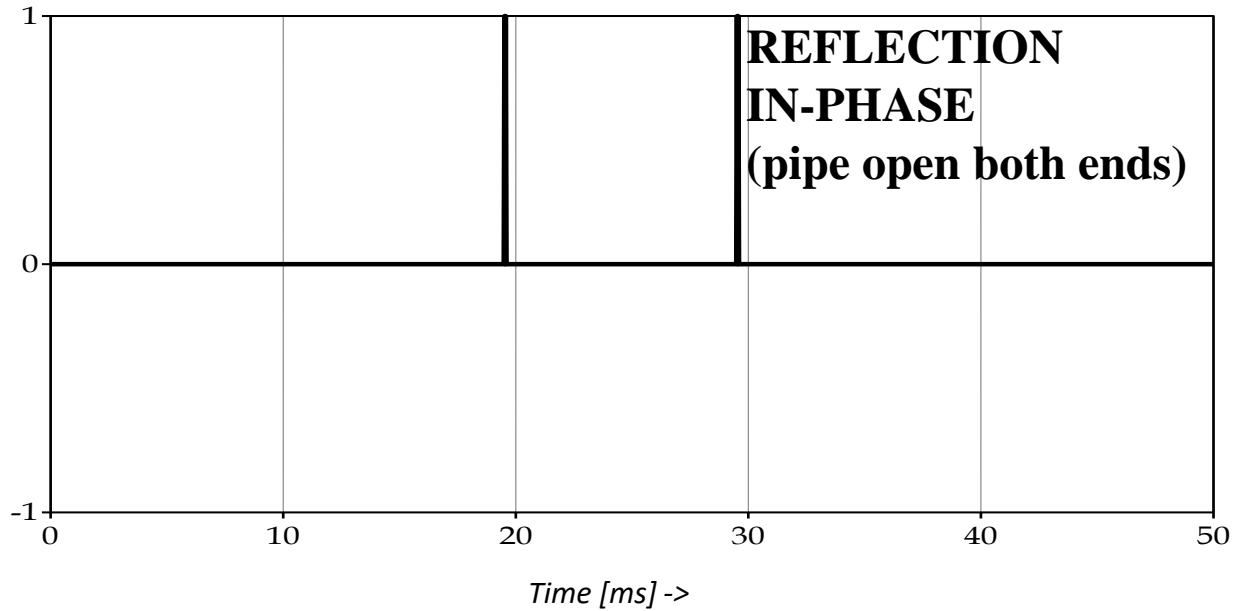


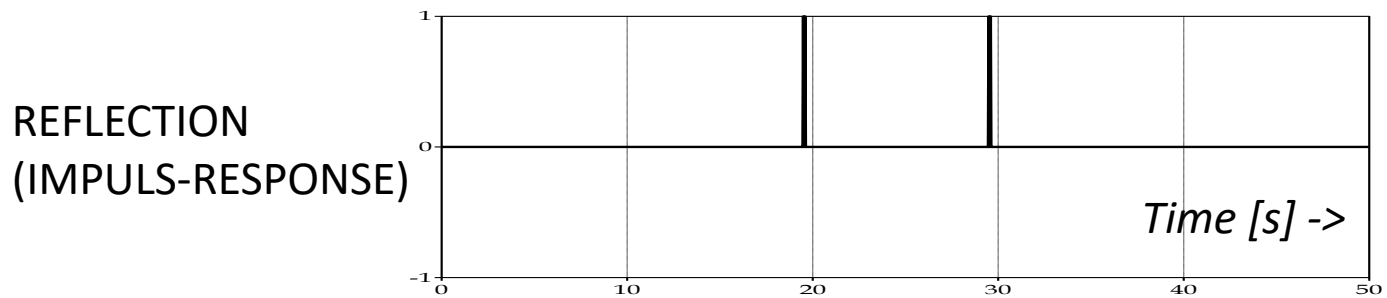
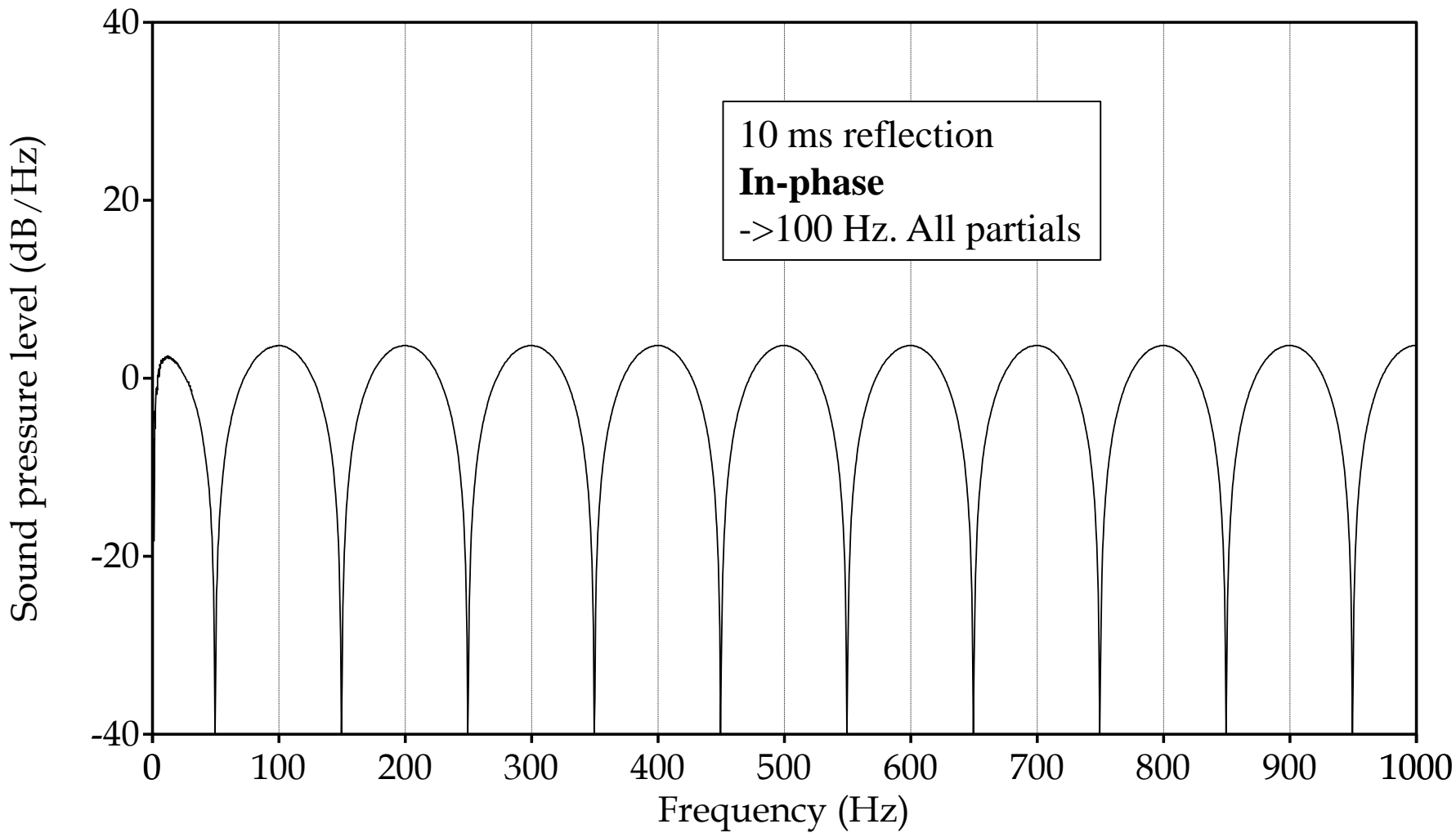
Freq [Hz]  
linear

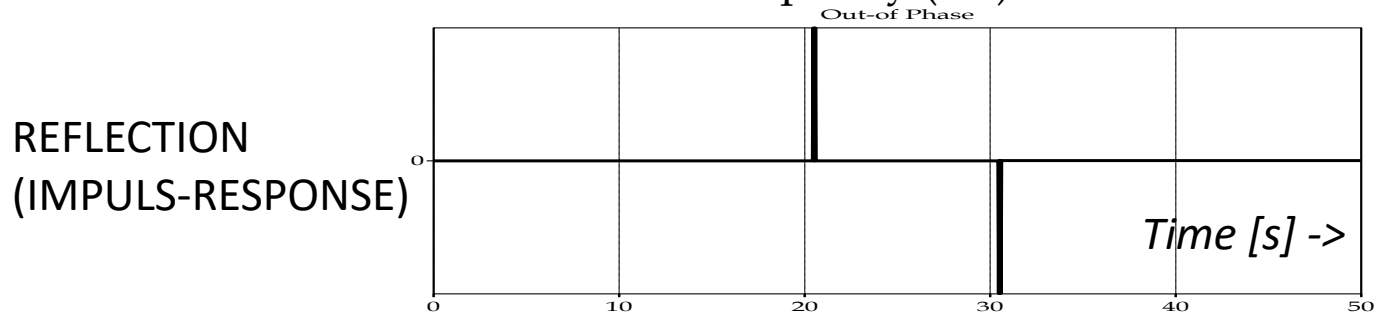
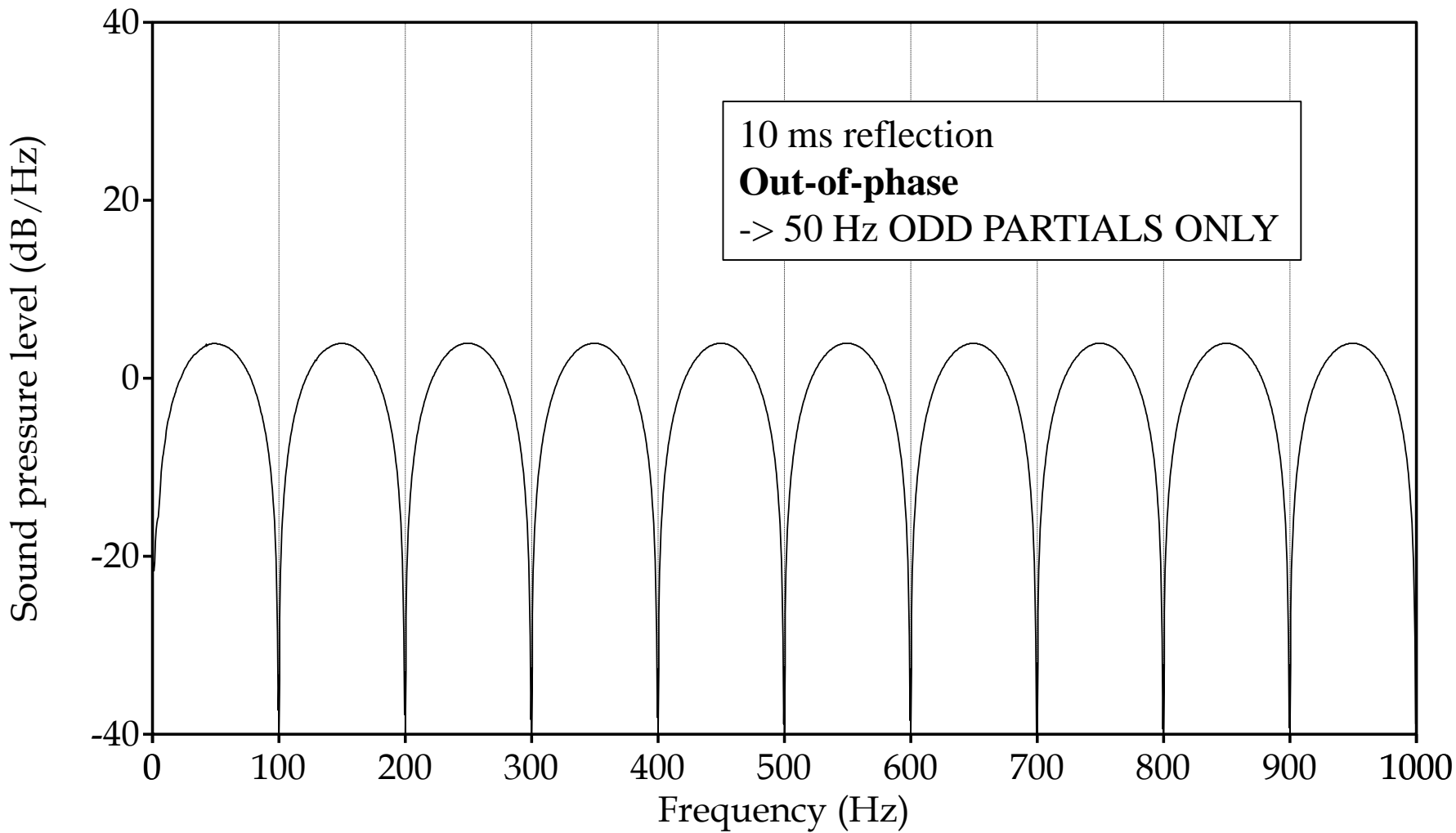
# SPECTROGRAM



Time s





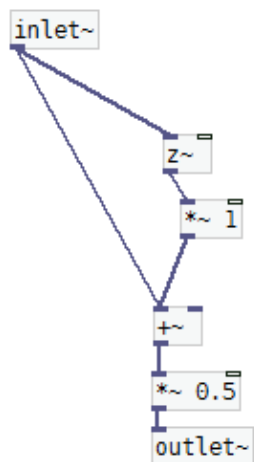


# SIDESTEP

**Mean of two and two samples** is often considered to give a **Low Pass filter**.

Ever wondered if that is the complete answer?

It is **actually a COMB FILTER**, with the first dip/ «tooth» at Nyquist!

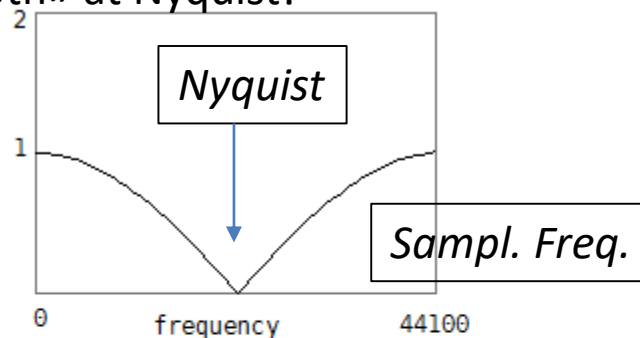


block~ 64 0 1

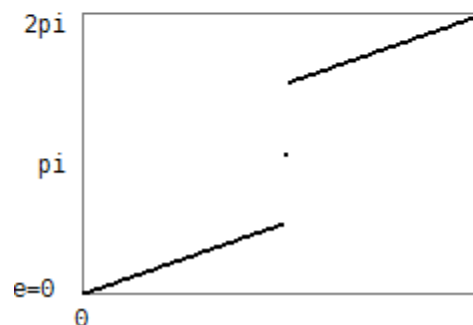
BlockSize,  
Overlap,  
Oversampling (factor of 2)

64=PdDefault

Frequency  
Response



Phase  
Response

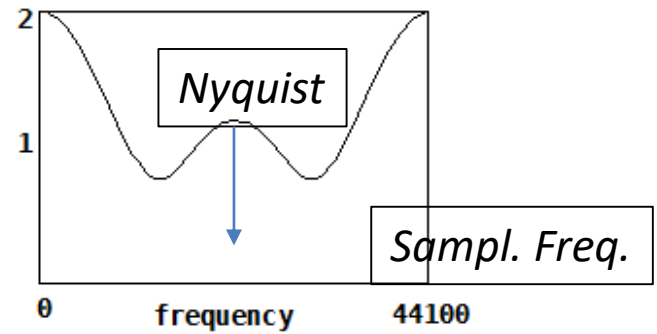


With a Group Delay (derivate of phase) of 0.5, constant for all frequencies.

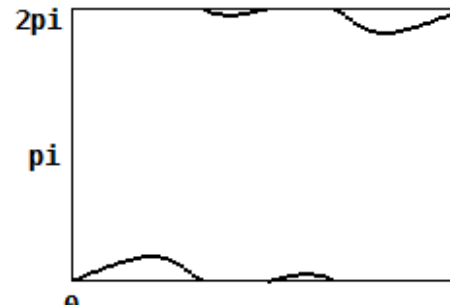
And the mean of 3 samples gives a Comb Filter with first tooth at Nyquist/3, and thus a LowPass for low freq, but HiPass for very high freq, towards Nyquist

The mean of 3 samples gives a Comb Filter with first dip /«tooth» at  $\text{Sampl. Rate}/3$ ,

Frequency Response



Phase Response



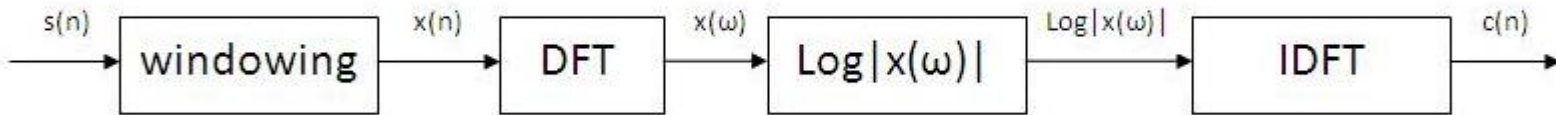
a LowPass for low freq, but  
HiPass for very high freq, towards Nyquist

"CEPSTRUM" =reversing the first four letters of "SPECTRUM".

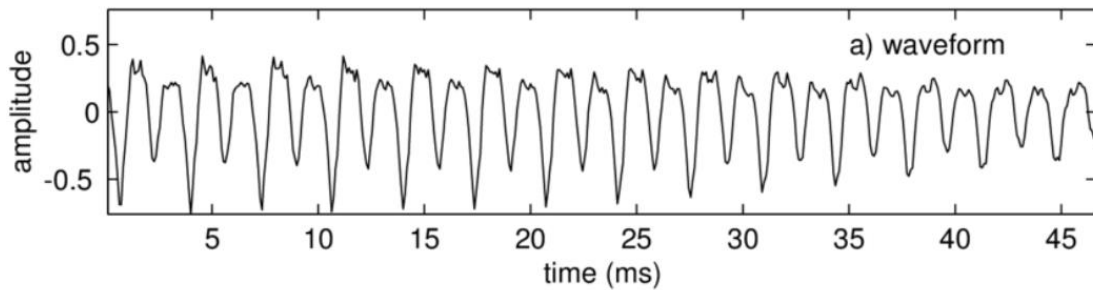


# CEPSTRUM

the inverse Fourier transform of the log magnitude spectrum.

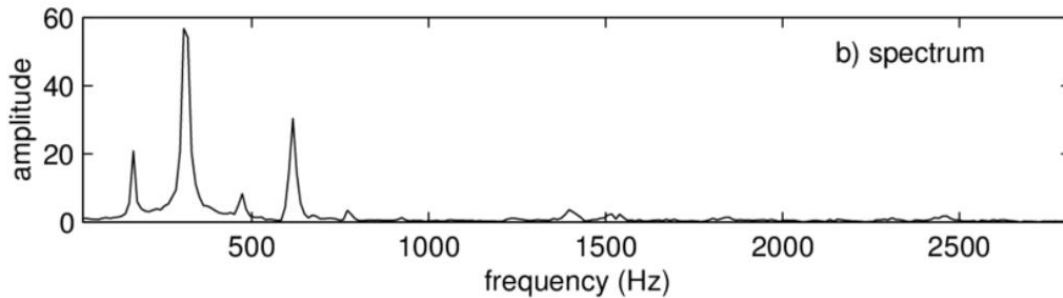


*complex cepstrum,*  
*real cepstrum,*  
***power cepstrum,***  
*phase cepstrum*

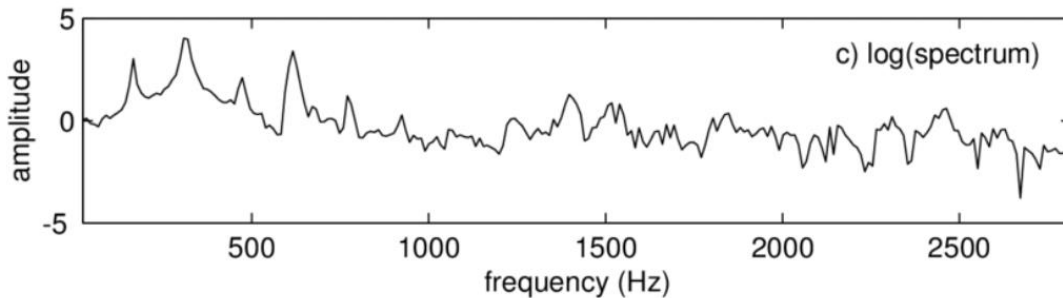


SIGNAL

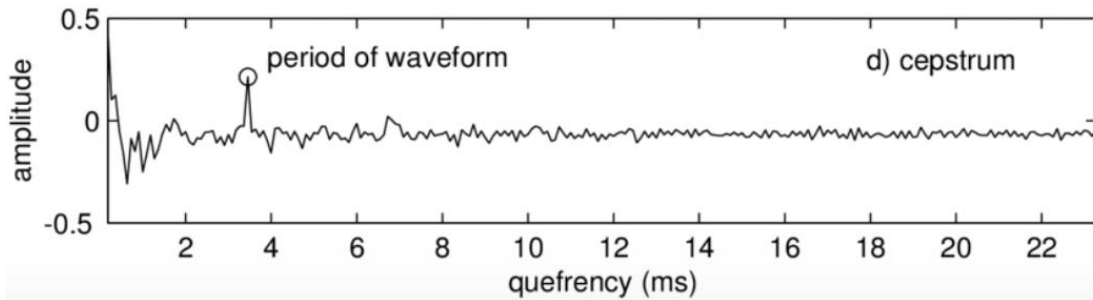
*Fourier* ->



SPECTRUM contains harmonics at evenly spaced intervals, whose **magnitude decreases quite quickly as frequency increases**



LOG SPECTRUM, **compresses the dynamic range and reduces amplitude differences in the harmonics**



*Fourier* ->

CEPSTRUM

x-axis: **QUEFREQUENCY**

*Quefrequency,*  
 ""TIME"" [s] or [samples]





# CEPSTRUM

Analysis of  
«Rhythmic Behavior»  
in the frequency domain.

CEPSTRUM:  
de-convolution

Separate **Source** and **Filter TIMBRE**

**Pitch-Detector**

**Echo-Detector**

**Rhythm-Detector(?)**

**convolution** of two signals = **addition** of their **complex cepstra**.

$$x_1 * x_2 \rightarrow x'_1 + x'_2$$

CEPSTRUM:  
de-convolution

**vocal excitation** (pitch) and **vocal tract** (formants) are **additive** in the logarithm of the power spectrum and thus clearly separate.

The **cepstrum** projects all the slowly varying components in log magnitude spectrum to the low frequency region and fast varying components to the high frequency regions.

In the log magnitude spectrum, the slowly varying components represent the envelope corresponds to the vocal tract and the fast varying components to the excitation source.

As a result the vocal tract and excitation source components get represented naturally in the spectrum of speech.

The initial few values in the cepstrum typically 13-15 cepstral values represent the vocal tract information

The **power cepstrum** = squared magnitude of the inverse Fourier transform of the logarithm of the squared magnitude of the Fourier transform of a signal

$$= \left| \mathcal{F}^{-1} \left\{ \log(|\mathcal{F}\{f(t)\}|^2) \right\} \right|^2$$

The *complex cepstrum* is defined as the Inverse Fourier transform of the logarithm (with unwrapped phase) of the Fourier transform of the signal. This is sometimes called the spectrum of a spectrum.

complex cepstrum of signal = IFT(log(FT(the signal))+j2πm)

(where *m* is the integer required to properly unwrap the angle or imaginary part of the complex log function)

Many texts define the process as FT → abs() → log → IFT, i.e., that the cepstrum is the "inverse Fourier transform of the log-magnitude Fourier spectrum". (the difference between squaring or taking the absolute value amounts to an overall factor of 2)

**MFCC** Mel Filter Cepstral Coefficients. (Speech recognition)

Combines the advantages of the cepstrum with a frequency scale based on critical bands

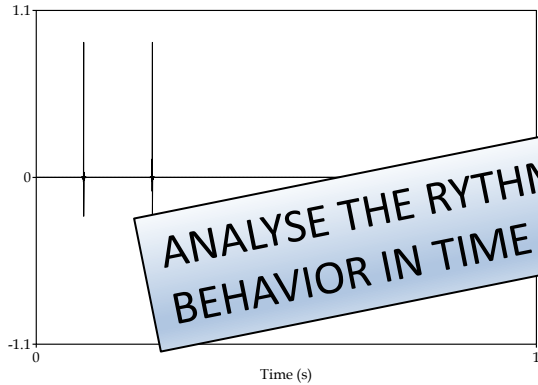
**LPC** Linear Prediction Cepstral Coefficients

**SIFT** *Simplified Inverse Filter Tracking algorithm*

Encompasses the desirable properties of both autocorrelation and cepstral pitch analysis techniques.

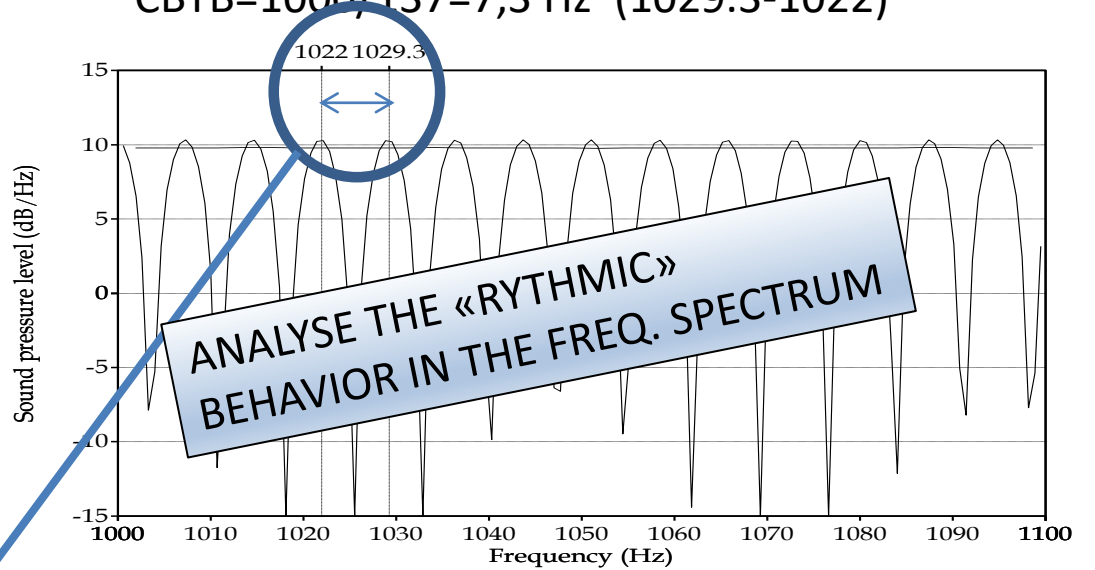
# Dirac Pulse + Reflection

$\Delta t = 137 \text{ ms}$



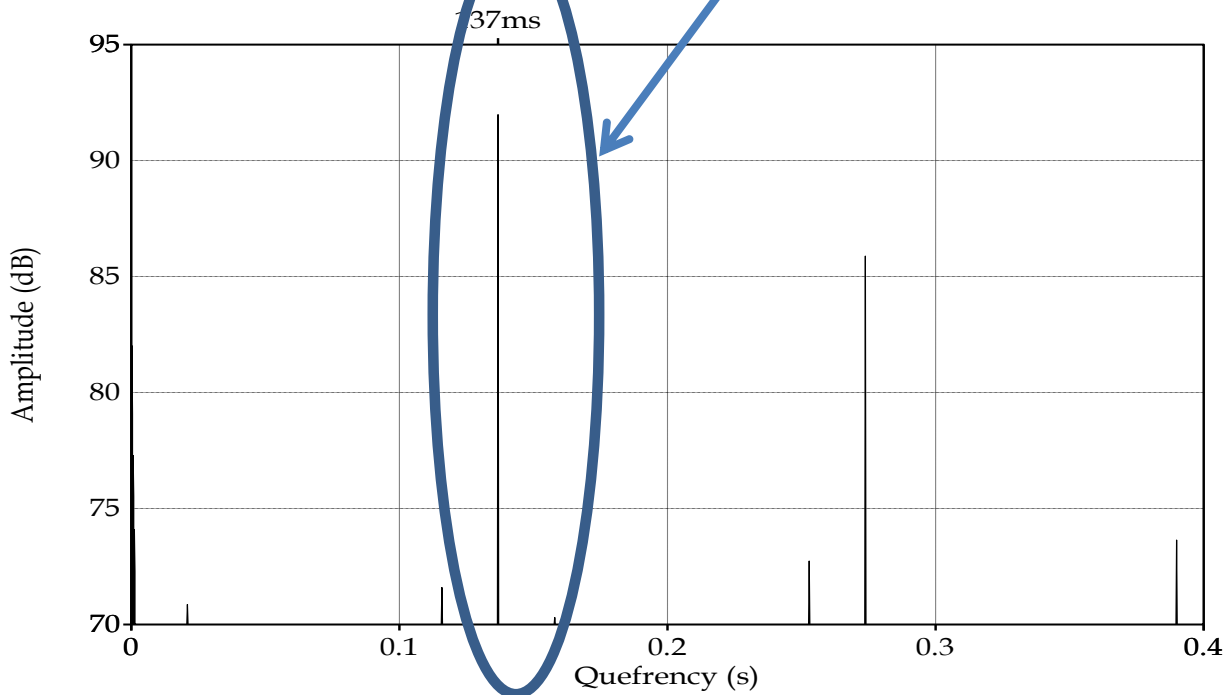
ANALYSE THE RYTHMIC BEHAVIOR IN TIME

SPECTRUM  $CBTB = 1/\Delta t$   
 $CBTB = 1000/137 = 7,3 \text{ Hz}$  (1029.3-1022)



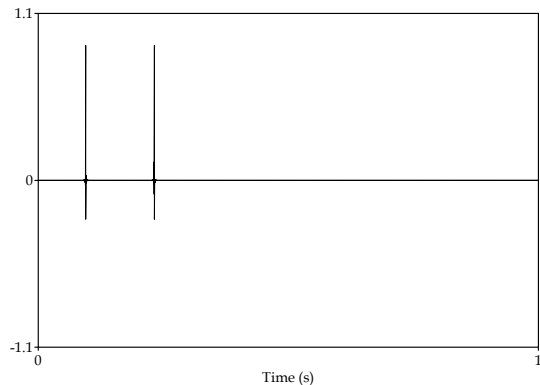
ANALYSE THE «RYTHMIC» BEHAVIOR IN THE FREQ. SPECTRUM

## POWER SPECTRUM

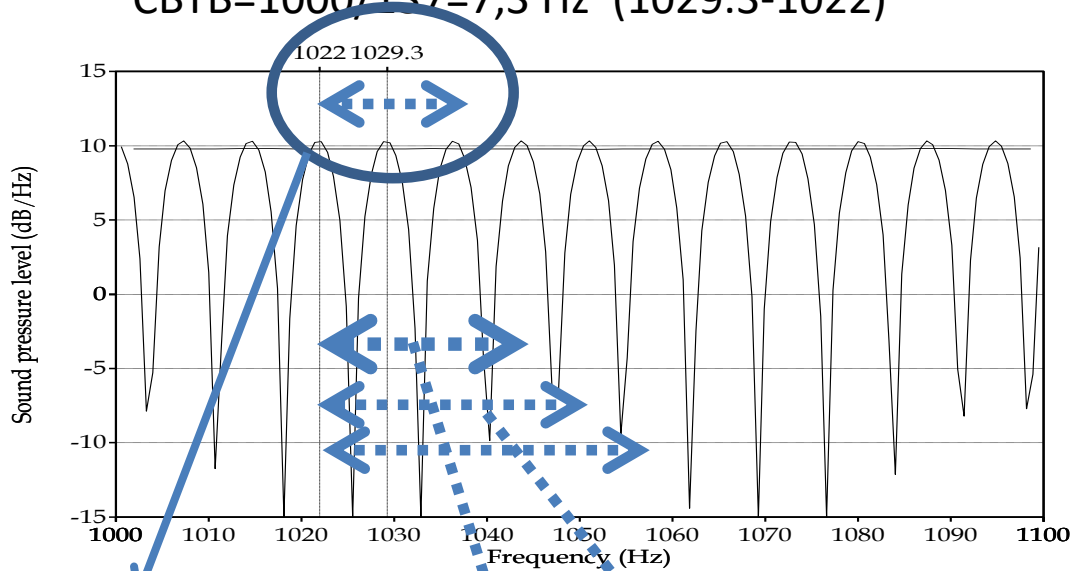


# Dirac + reflection

$\Delta t = 137 \text{ ms}$

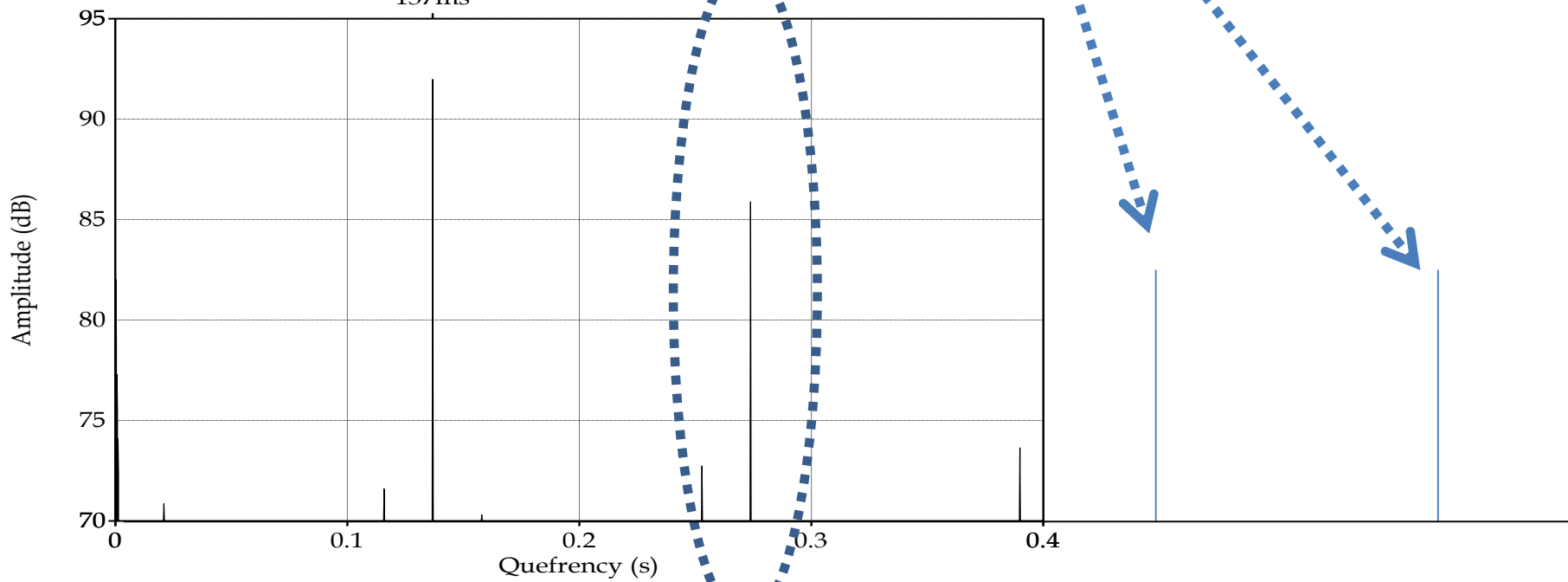


SPECTRUM CBTB=  $1/\Delta t$   
CBTB=  $1000/137=7,3 \text{ Hz}$  (1029.3-1022)



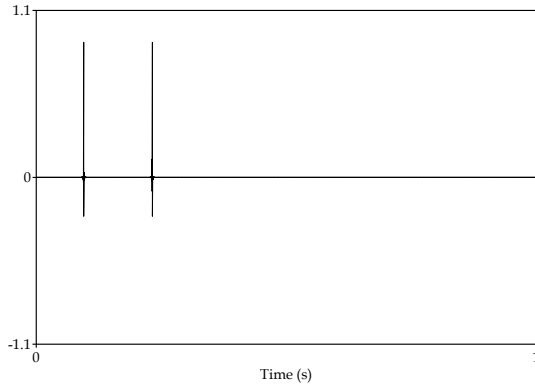
## POWER CEPSTRUM

137ms

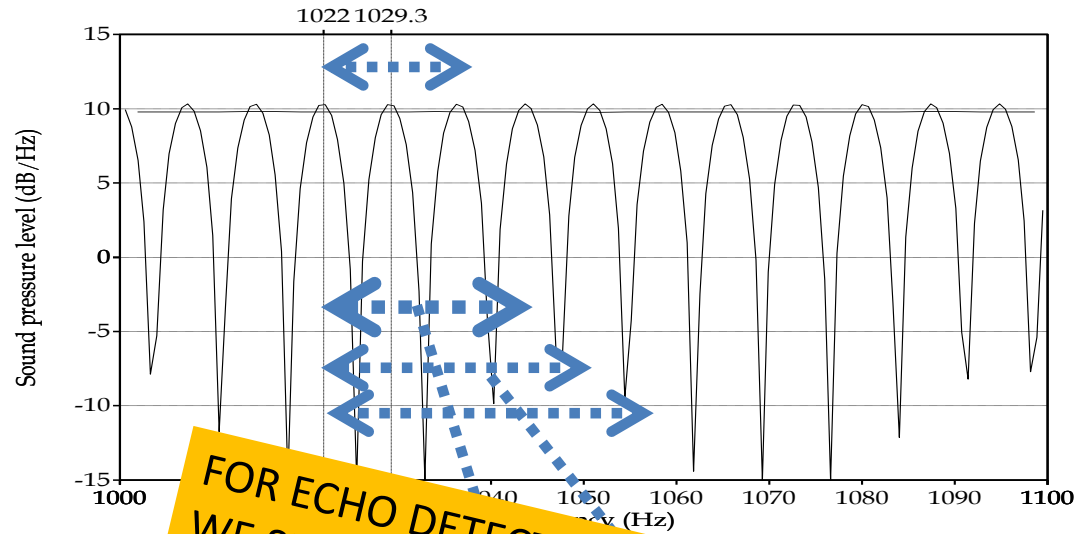


# Dirac + reflection

$\Delta t = 137 \text{ ms}$

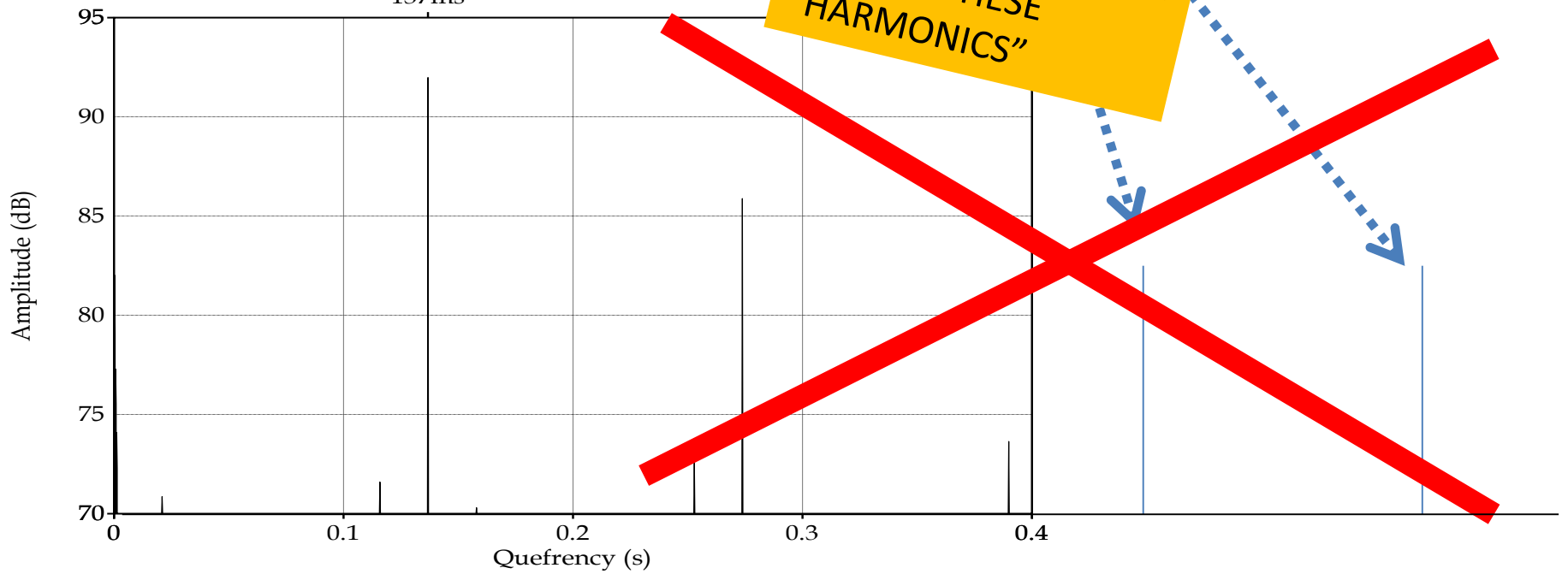


SPECTRUM CBTB=  $1/\Delta t$   
CBTB=  $1000/137=7,3 \text{ Hz}$  (1029.3-1022)



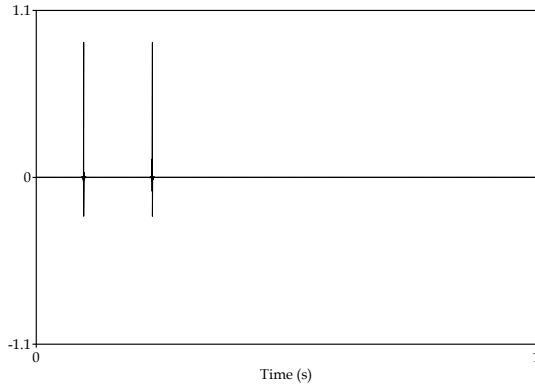
## POWER CEPSTRUM

137ms

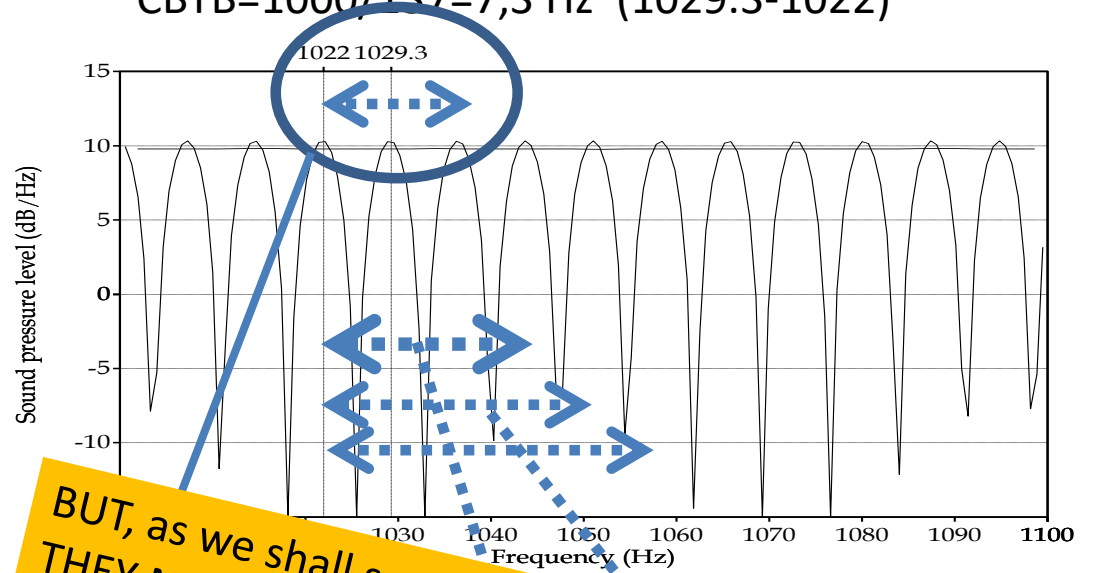


# Dirac + reflection

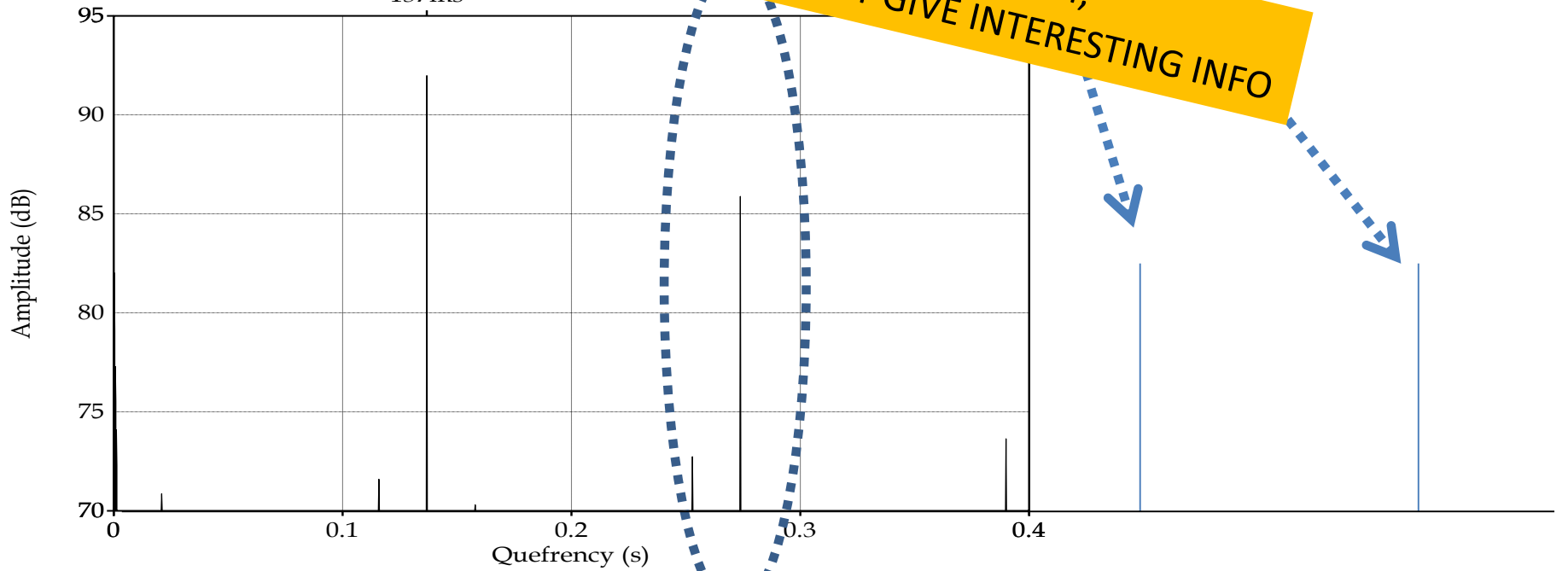
$\Delta t = 137 \text{ ms}$



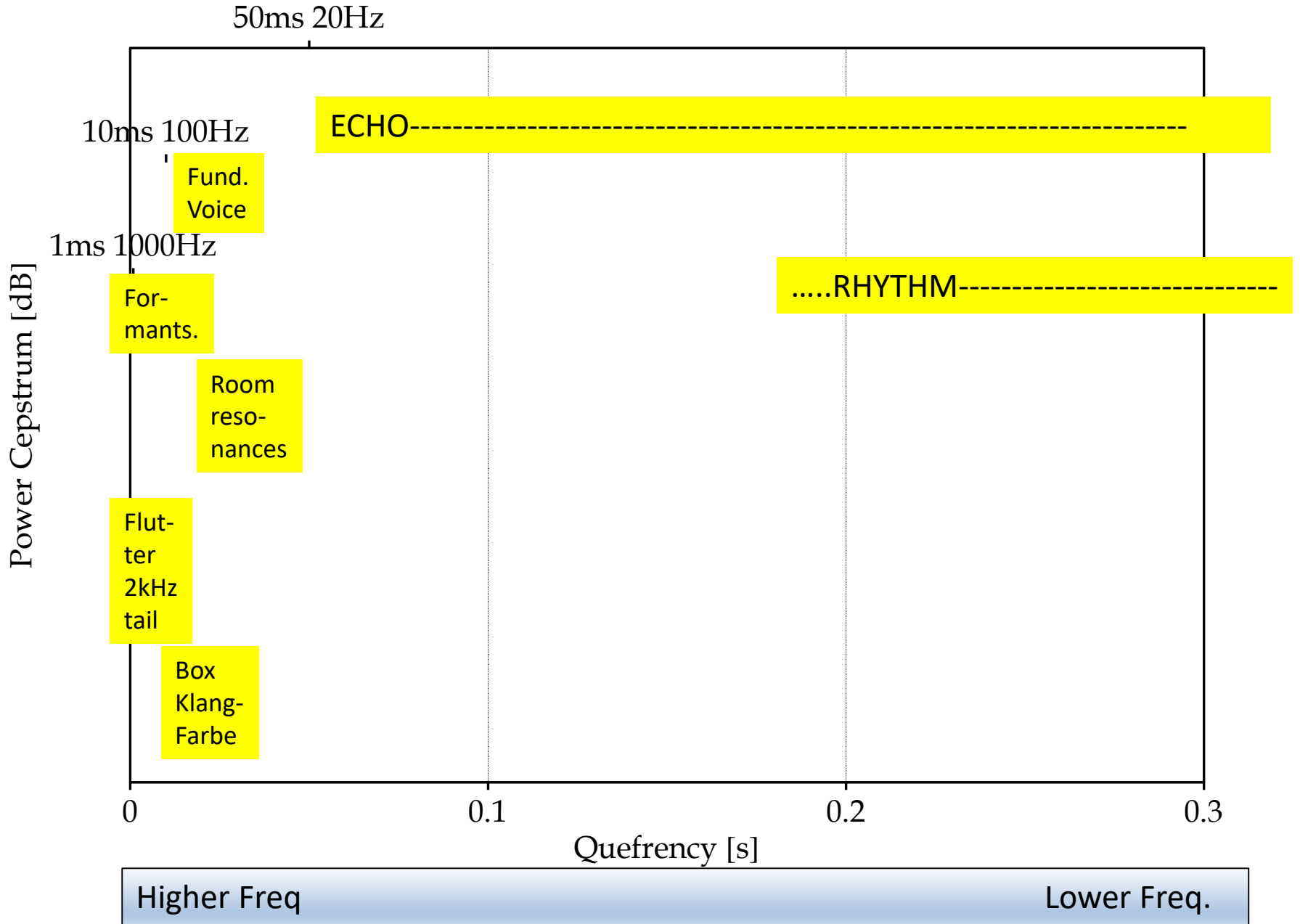
SPECTRUM CBTB=  $1/\Delta t$   
CBTB=  $1000/137=7,3 \text{ Hz}$  (1029.3-1022)



POWER CEPSTRUM  
137ms



# POWER CEPSTRUM





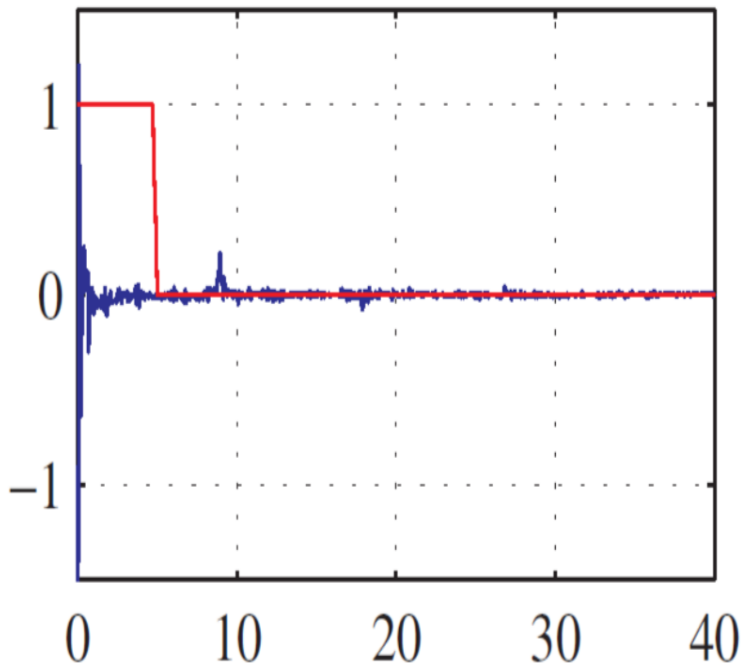
**LIFTING** =

  
**FILTERING** in the Quefrequency domain  

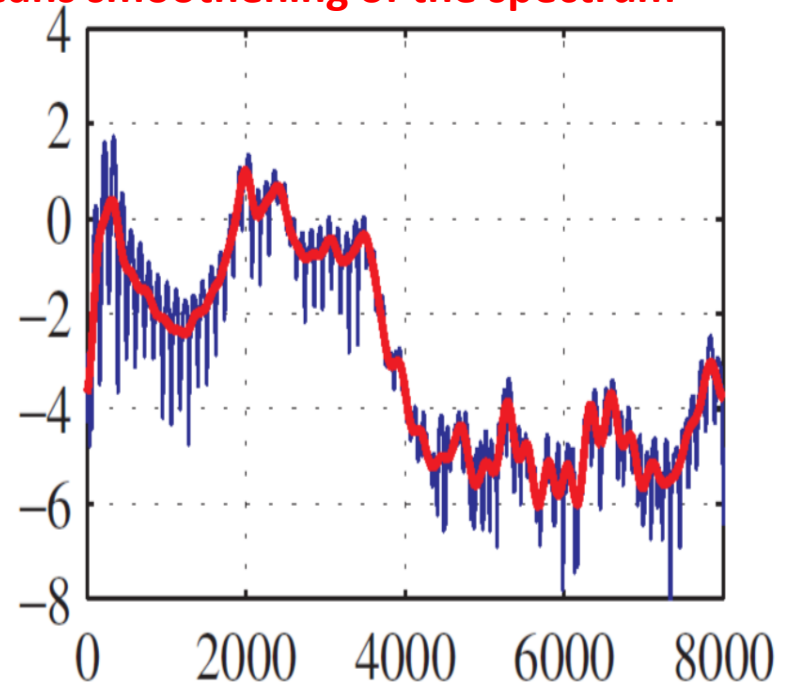

Looking at just the region of  
quefrequencies we want

## Liftering in the cepstral domain

The red “Lifter” removes the things happening fast (low in [s]),  
means smoothing of the spectrum

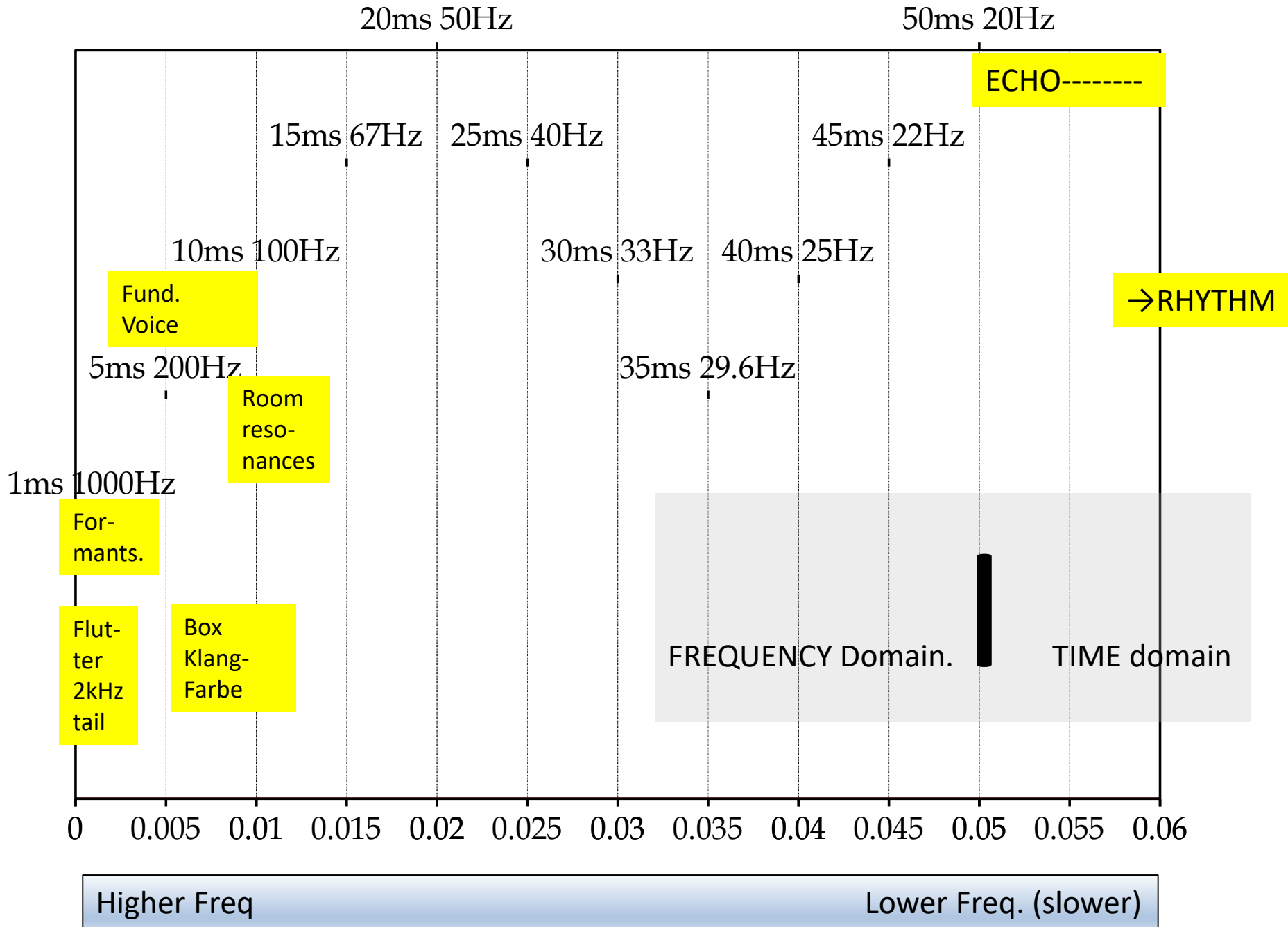


*Time (or Samples) ->*



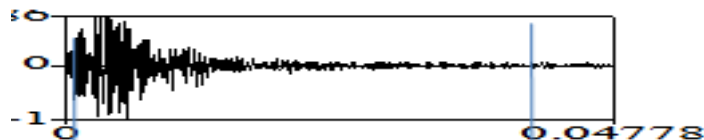
*Frequency [Hz]->*

# POWER CEPSTRUM

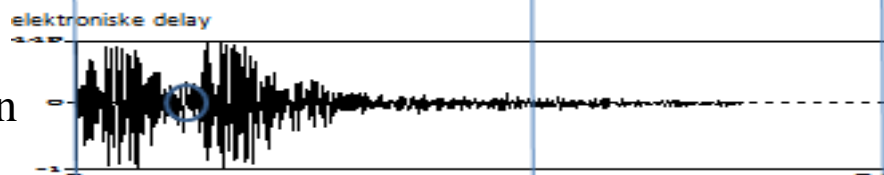


# CEPSTRUM and AUTOCORRELATION to detect reflections (echoes)

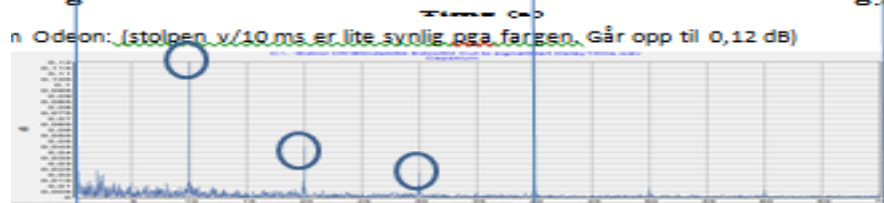
Original, waveform



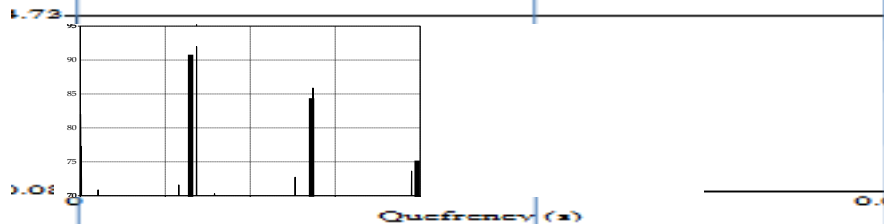
Original + 10 ms delayed reflection



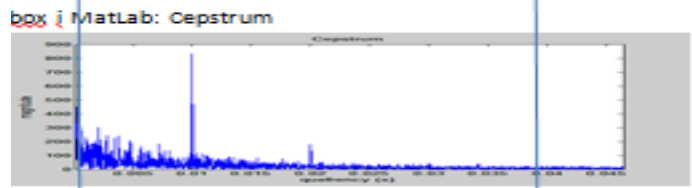
Cepstrum (Odeon)



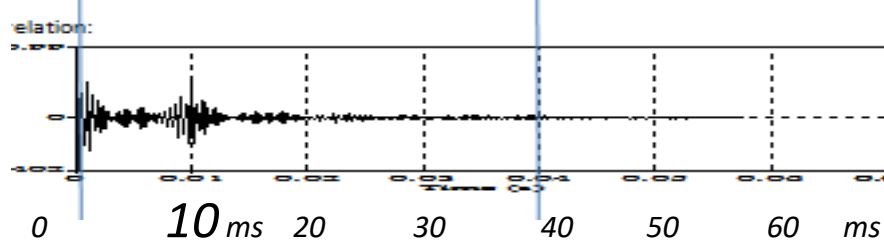
Cepstrum (Praat)



Cepstrum MIR-toolbox (MatLab)



Autocorrelation (Praat)





UiO : Department of Musicology  
University of Oslo

# SAM PHILLIPS' SLAP BACK ECHO; *LUCKILY IN MONO*

**Tor Halmrast**  
Head of Acoustics, Statsbygg  
Assoc. Prof., Univ. Oslo/Musicology  
Norwegian Ac. Of Music



*Art of Record Production, St.holm 1-3 dec 2017*

[Sam Phillips](#)  
[The Memphis Recording Service.](#)  
[SUN Studios](#)

“..60 -120 milliseconds?”

“At 60 Milliseconds, you don’t hear much doubling,  
but everything sounds a little thicker and fatter”

“At 120 Milliseconds you are REALLY starting to hear  
the distinct doubling of the sound”.

Sam Philips: **Single TAPE-ECHO**  
(later: RCA-simulation: used a hallway as Rev.Chamber)

“...2 [Ampex 350](#) recorders”

“530ms will be too long, **163 ms** seemed to sound about right.  
...a little either side of a 1/16 note might be what it really comes down to”.

“..Scotty Moore’s guitar-work on “That’s All Right”

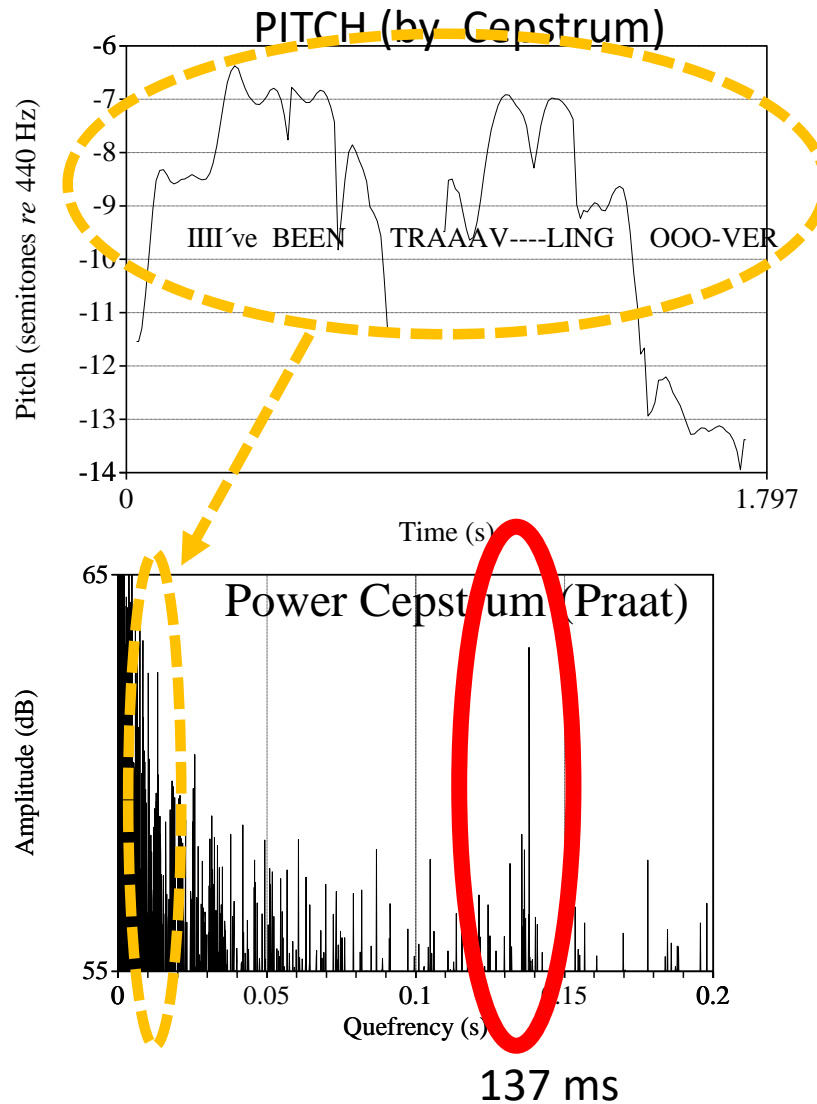
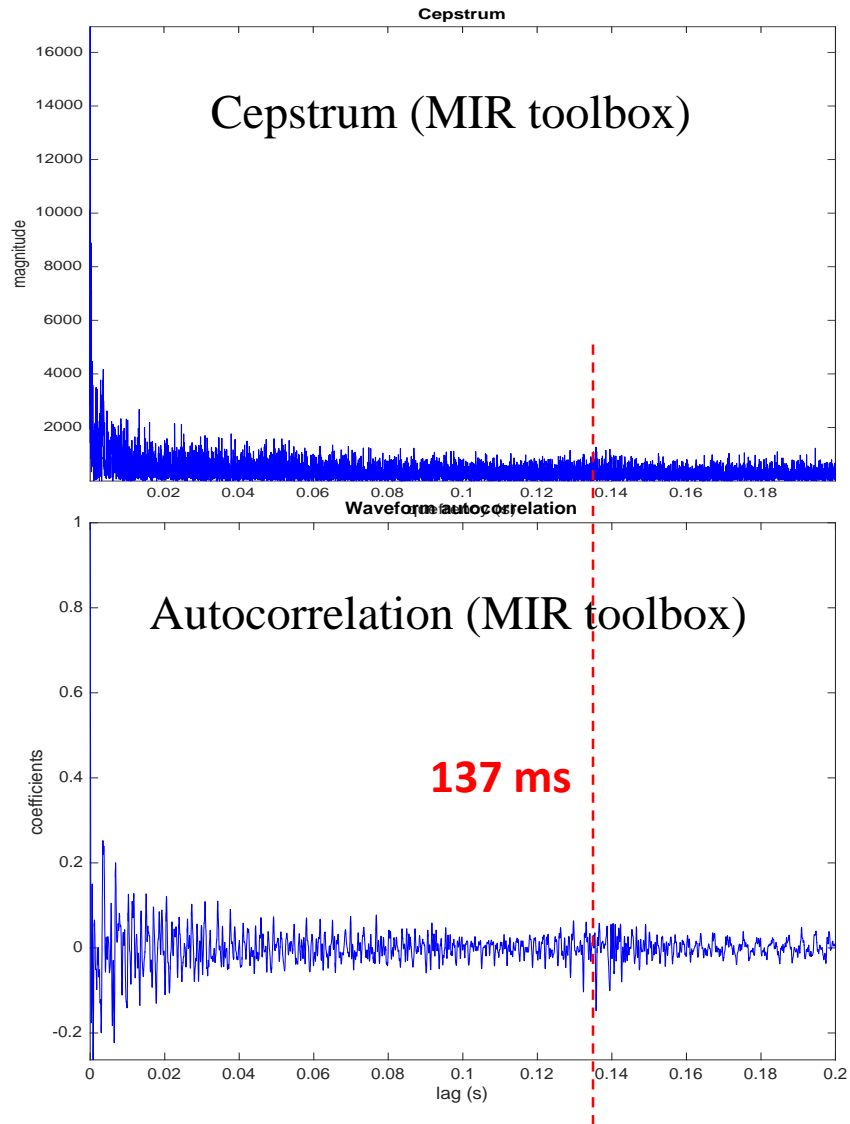
“...150 to 200ms with  
just one repeat at  
almost the same amplitude as the original signal”.

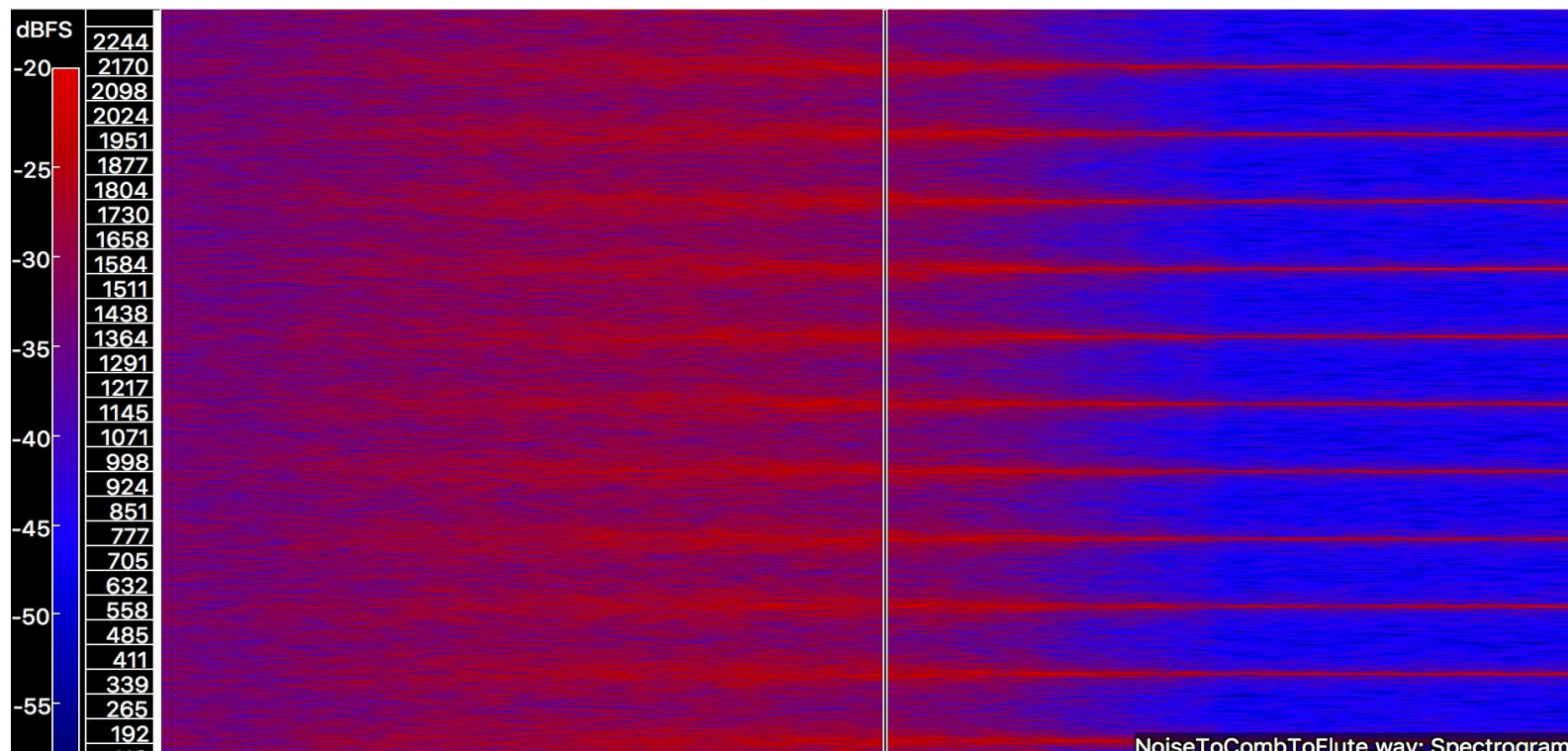
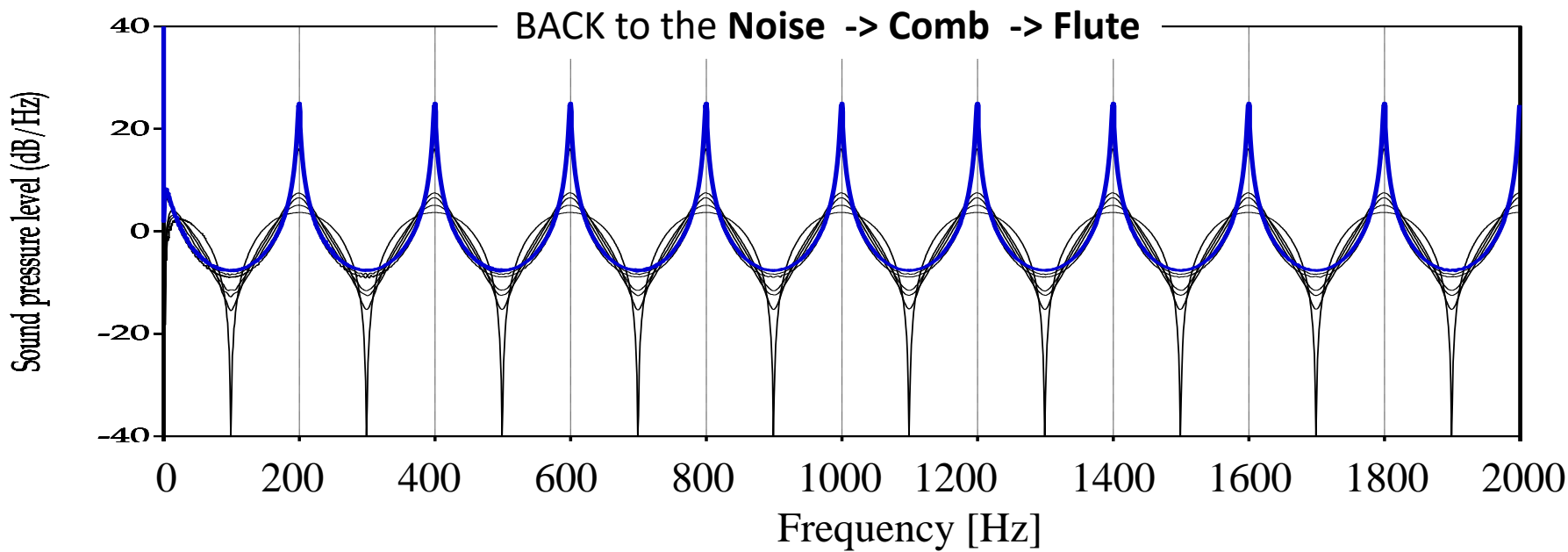
«..75 to 250 milliseconds),  
with little or no feedback»

«The physical space between heads,  
the speed of the tape, and  
the chosen volume being  
the main controlling factors»

# Tryin' to get to you

Sun Studios

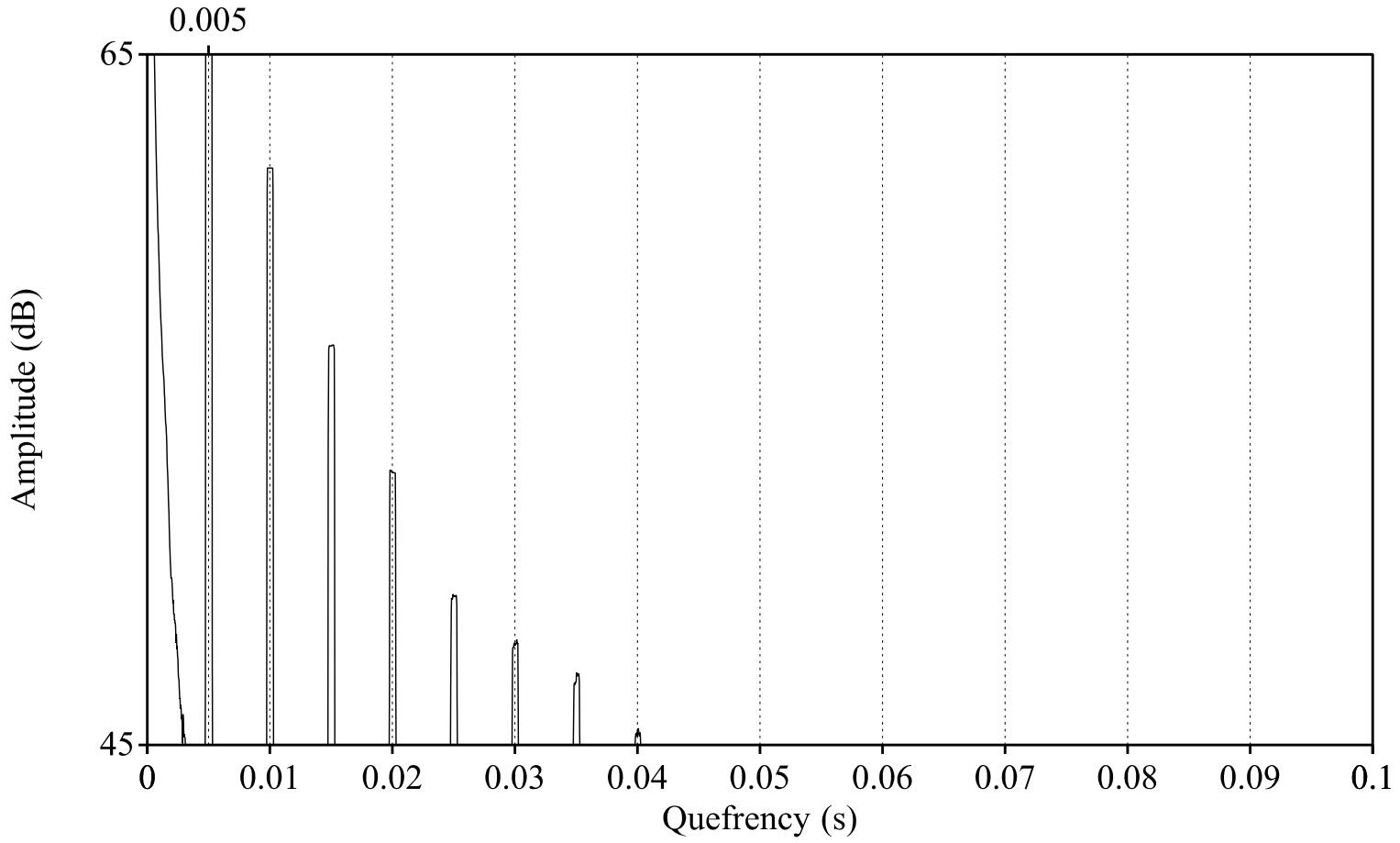




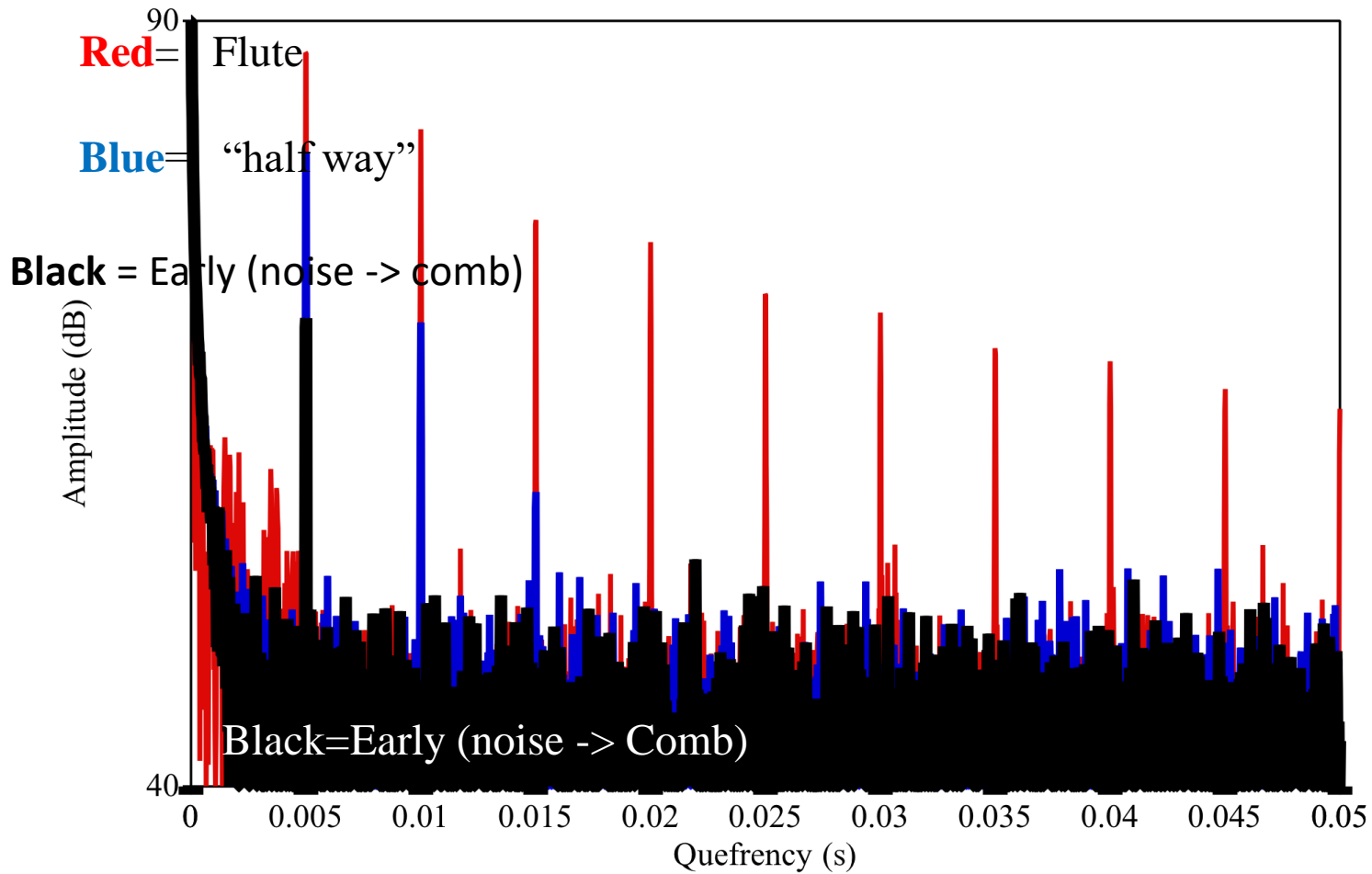


1/005s =  
200 Hz

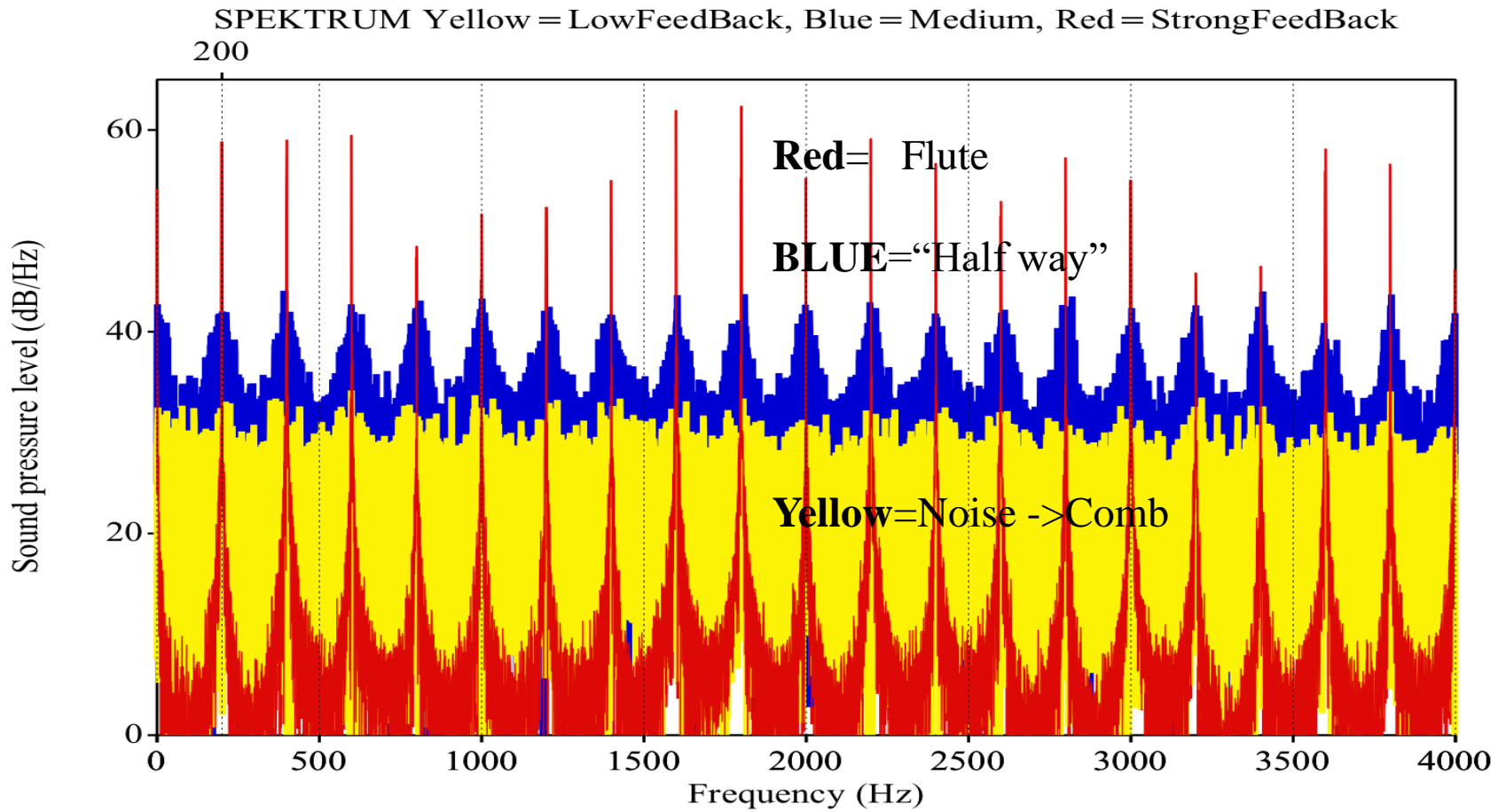
### Smoothed POWER CESPTRUM



Gradual change of  
Power Cepstrum  
over time for the  
**Noise->Comb->Flute** sound  
(increasing feed-back)



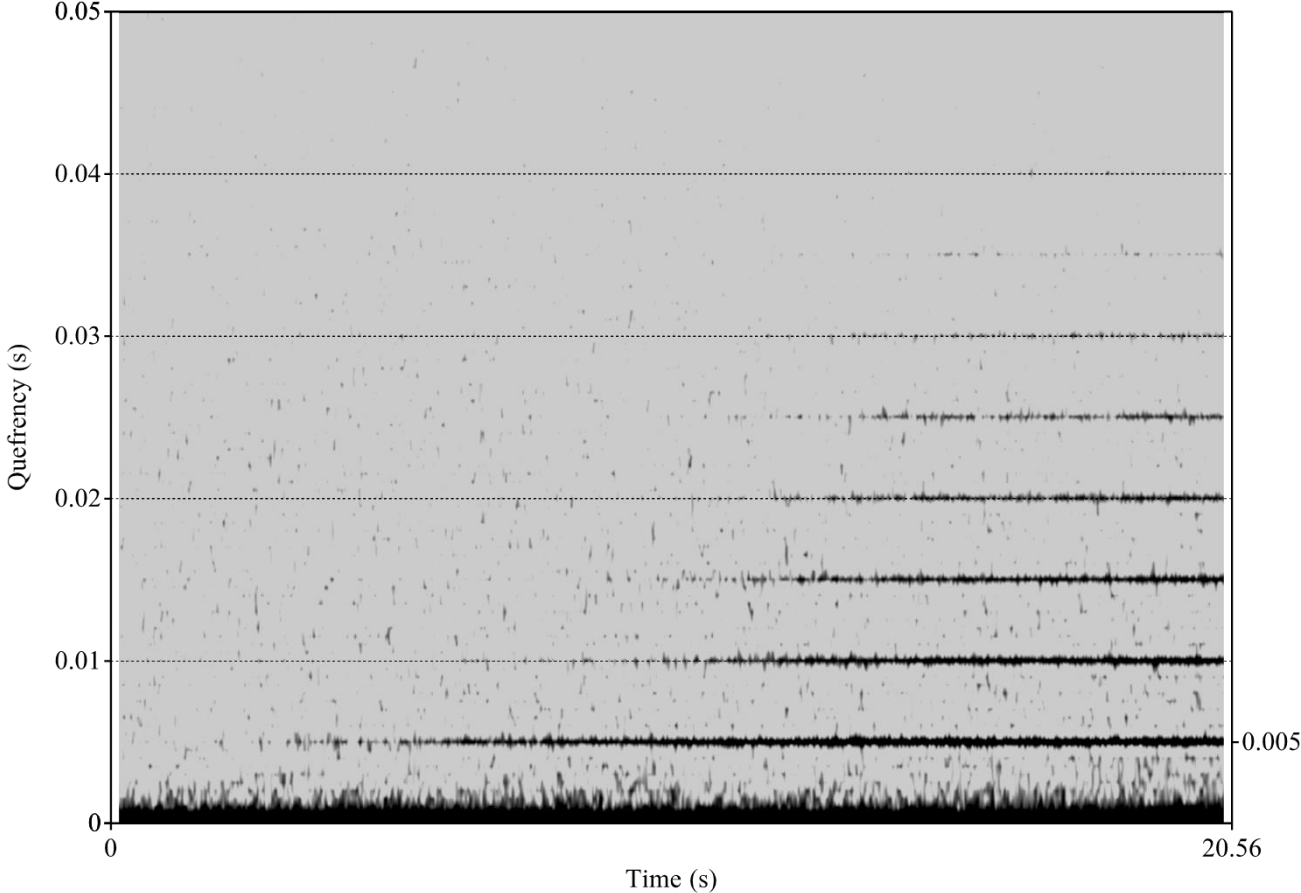
Gradual change of  
**SPECTRUM**  
over time for the  
**Noise->Comb->Flute** sound



# CEPSTROGRAM

NoiseToCombToFlute.wav

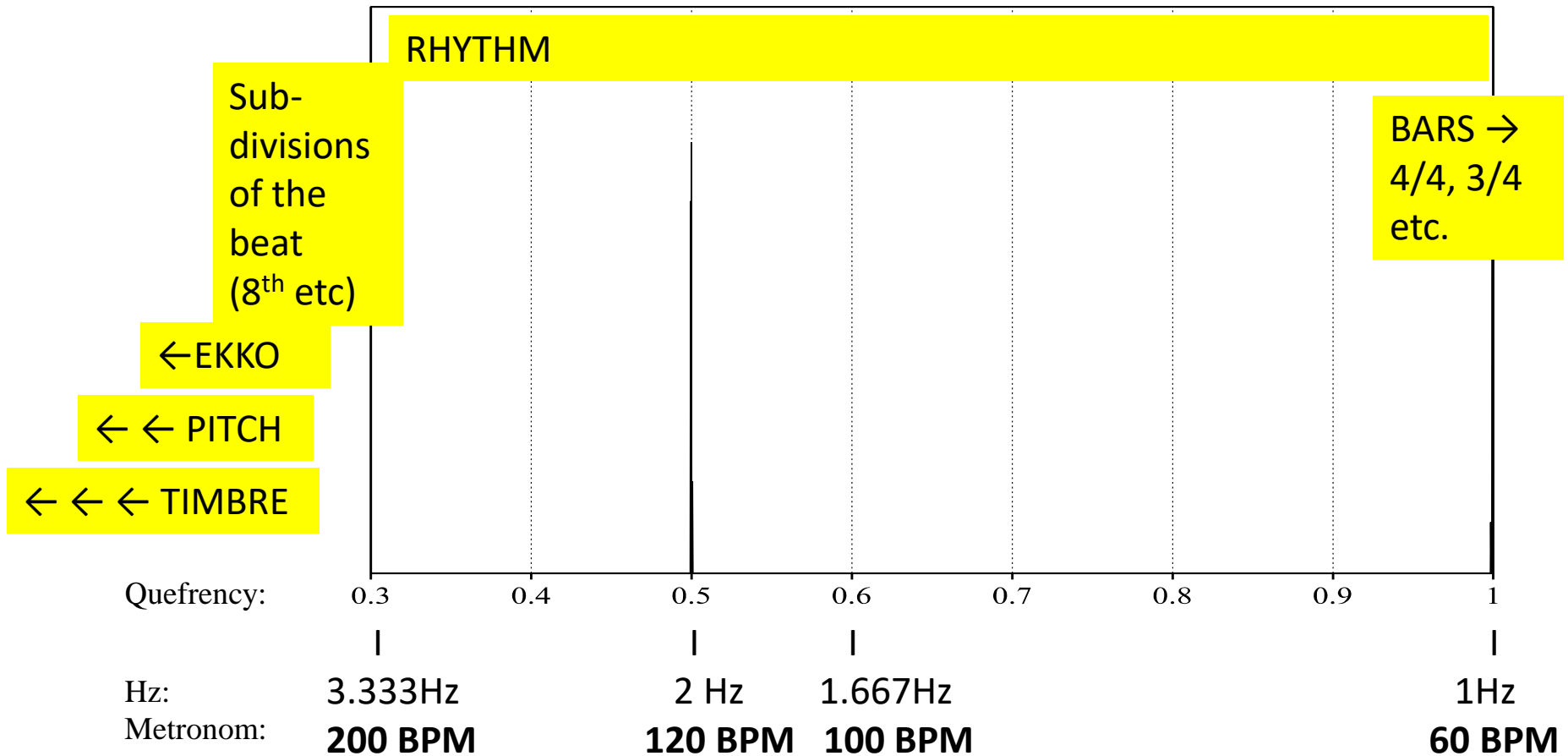
POWER CEPSTROGRAM Smoothed



# RHYTHM-ANALYSIS using CEPSTRUM?

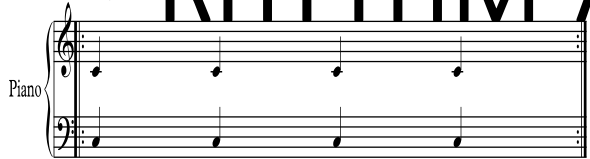
Zoom In (Liftering)

CEPSTRUM, range for RHYTHM

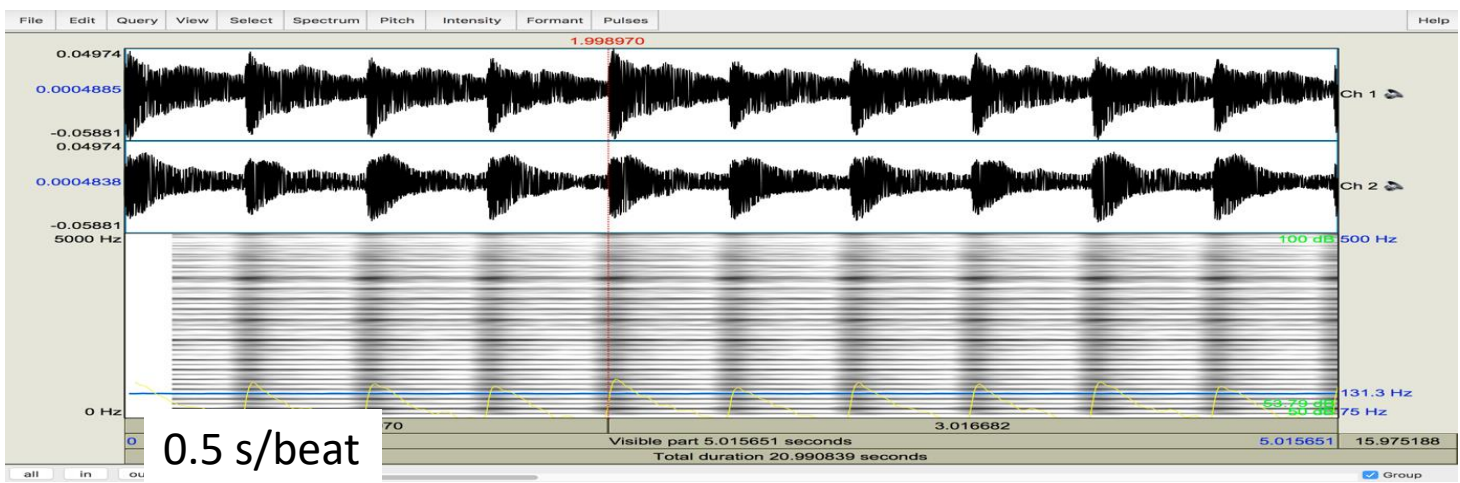


Repeat 12 times

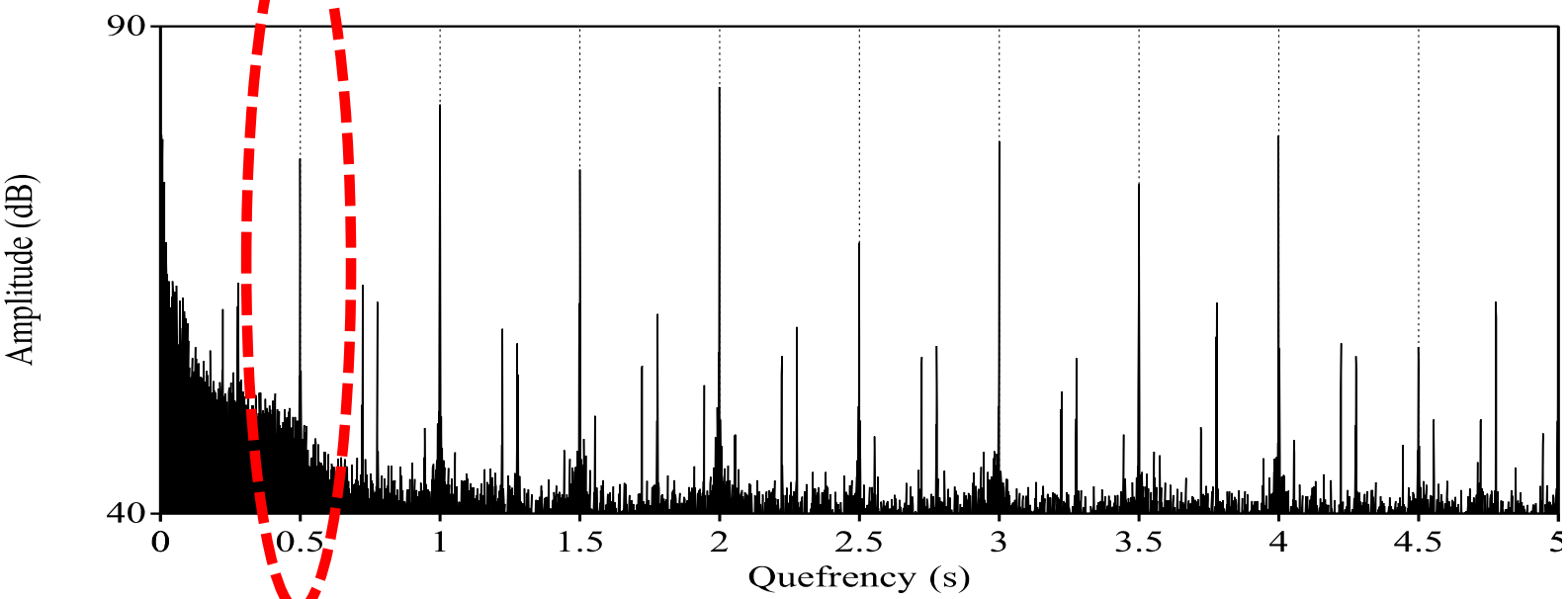
# RHYTHM-ANALYSIS using CEPSTRUM?



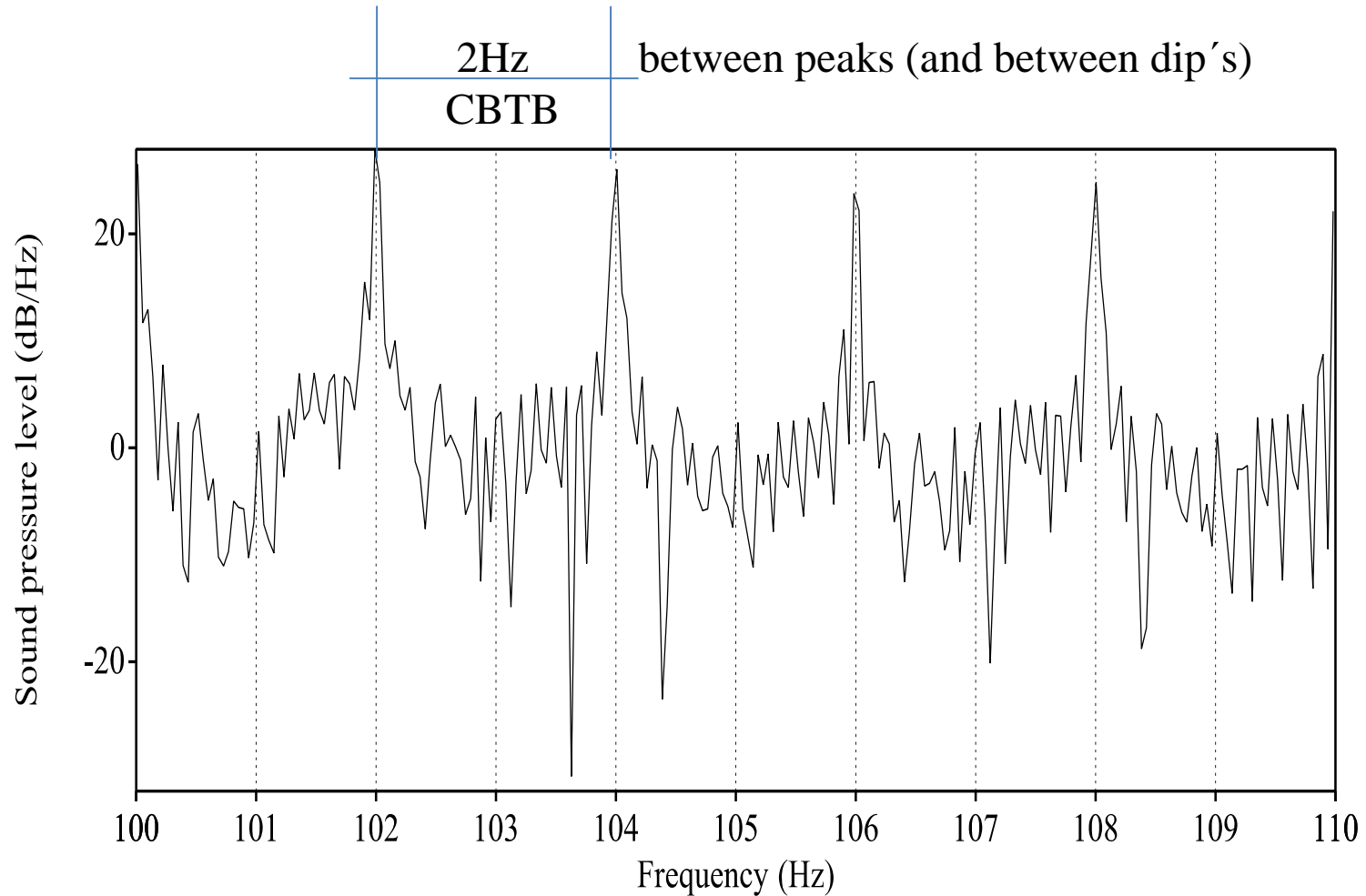
PIANO  
(Sibelius)



0.5 s/beat  
2 Hz  
120 BMP



Actually, this rhythm is shown also in a  
ZOOM-IN of the SPECTRUM:



But these changes in spectrum is not perceived (<<<Critical Bandwidth)

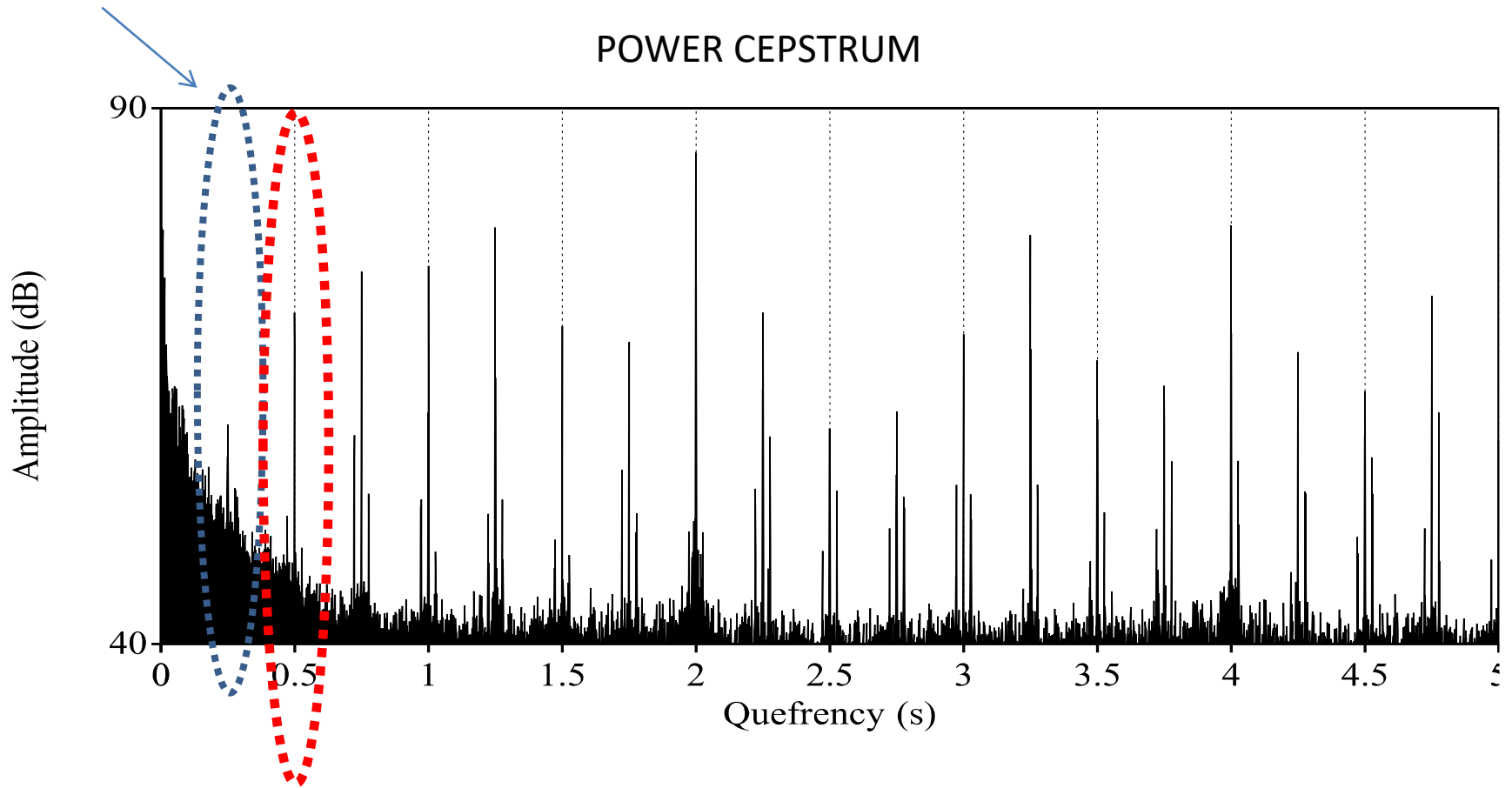
Repeat 12 times  
♩ = 120

Piano



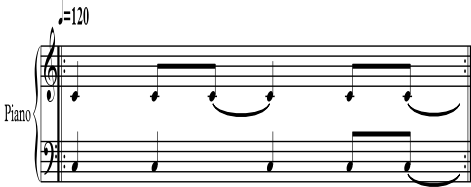
The syncopation adds a quefreny of half the beat

POWER CEPSTRUM

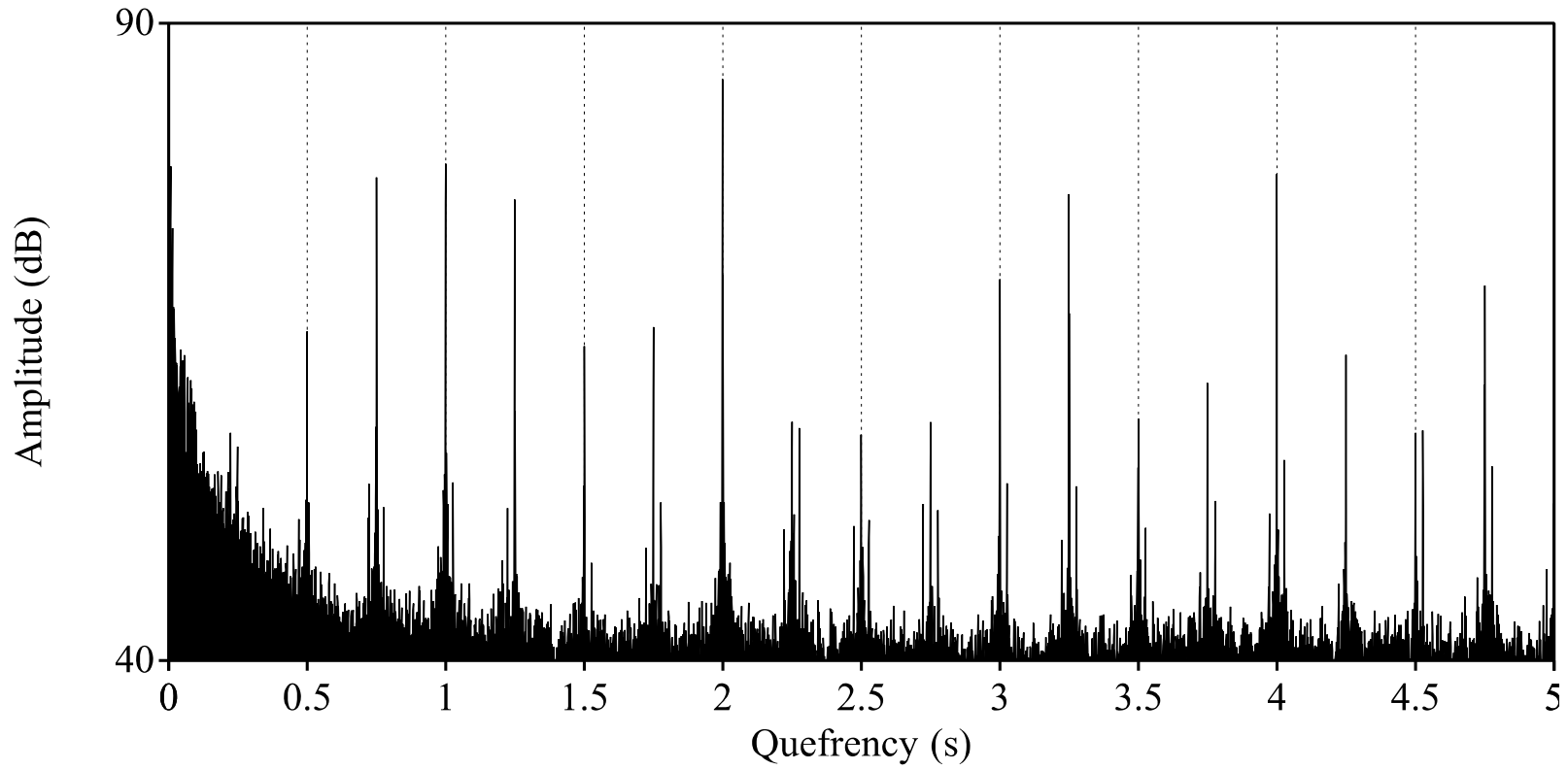




Repeat 12 times

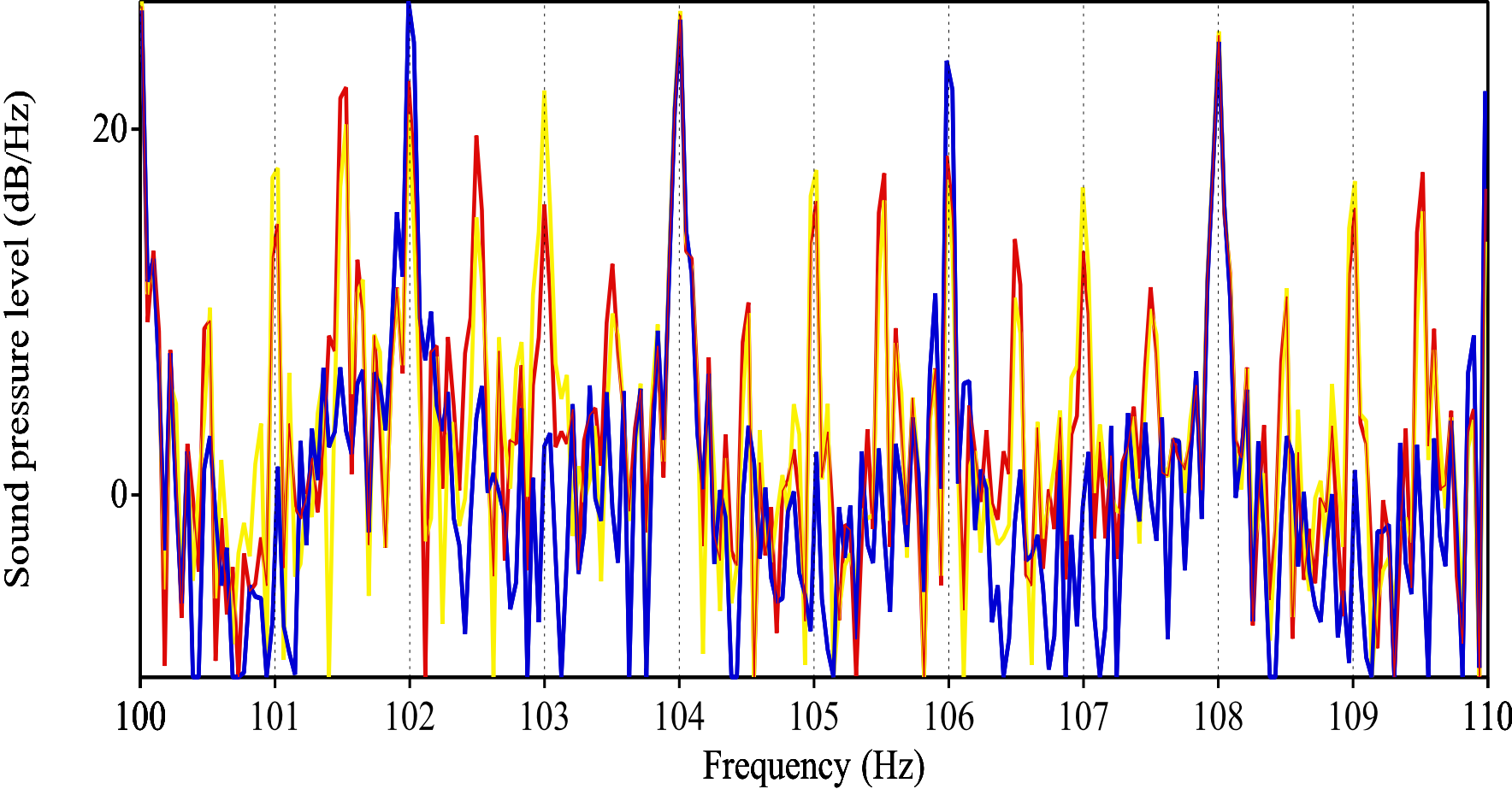


### POWER CEPSTRUM



# SPECTRUM (Zoom-In)

Blue = without Syncopation Red = Syncopation "4and", Yellow = + Syncopation "2and"

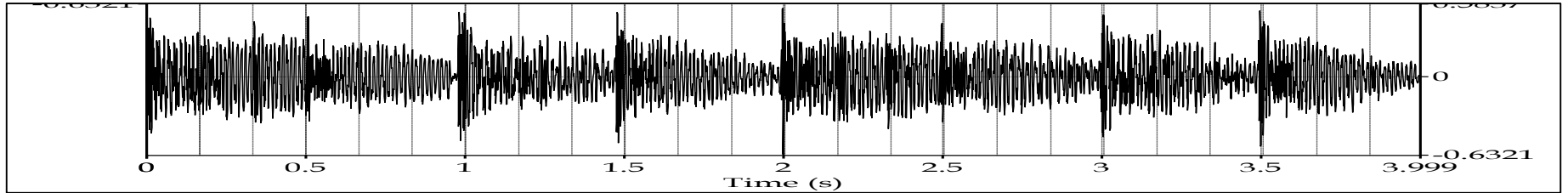


# DRUMS

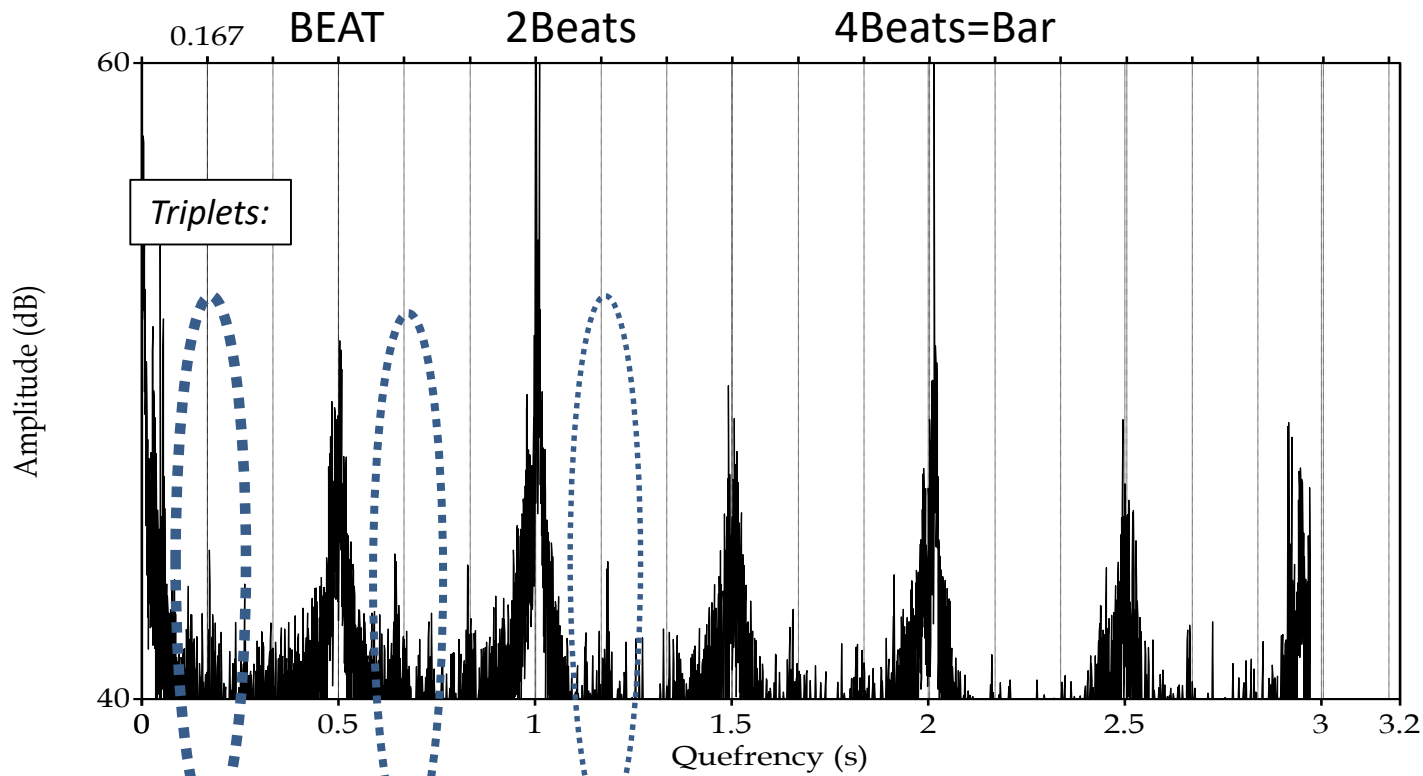
DRUMS\_120bmpSTART\_Triol:

(Sound File: «Drums» from NM Stillstand)

Sound File:



SMOOTHED POWER CEPSTRUM:

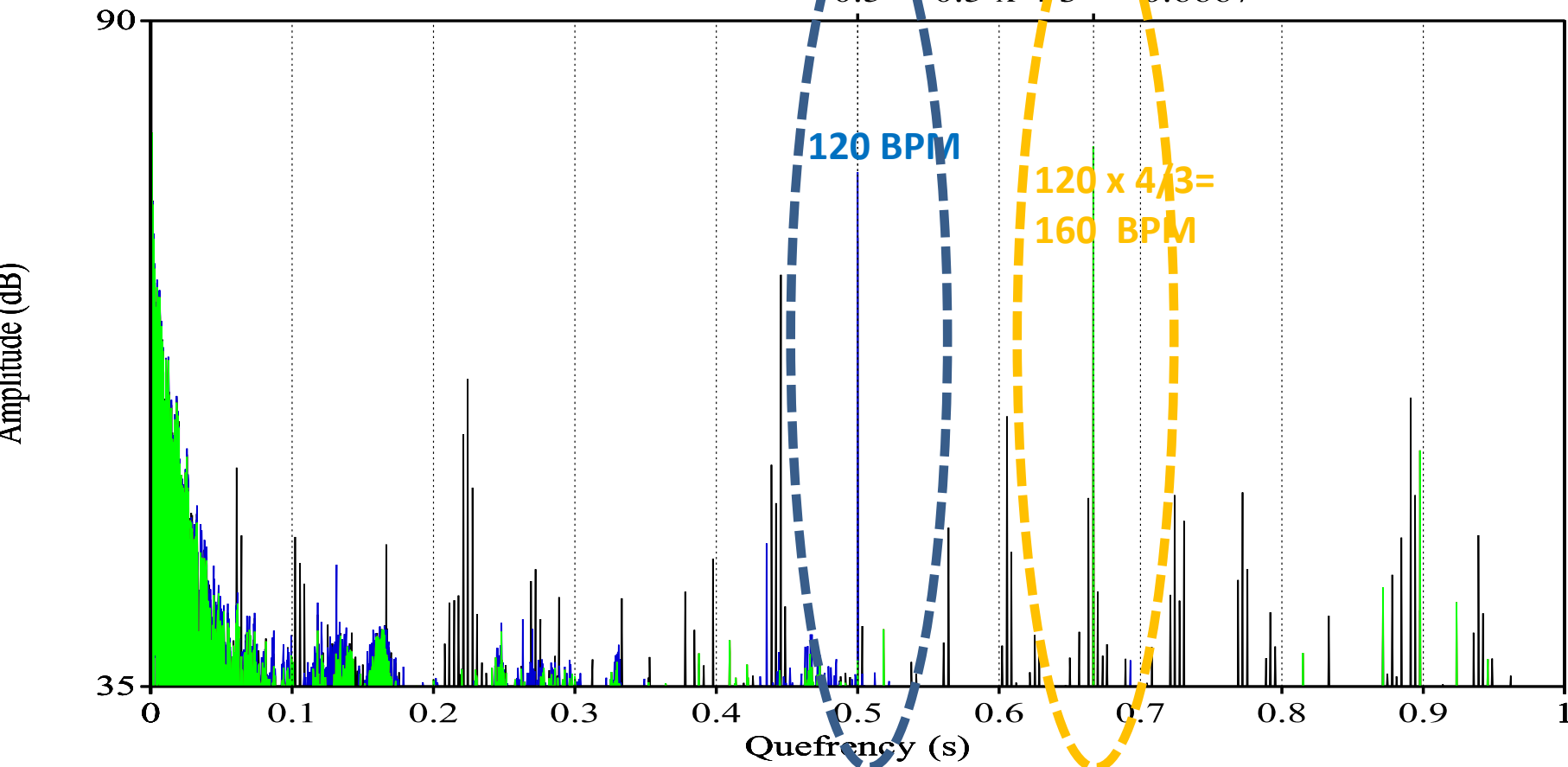


# POLY-RHYTHMS : Both 4/4, but Tempo 3 against 4



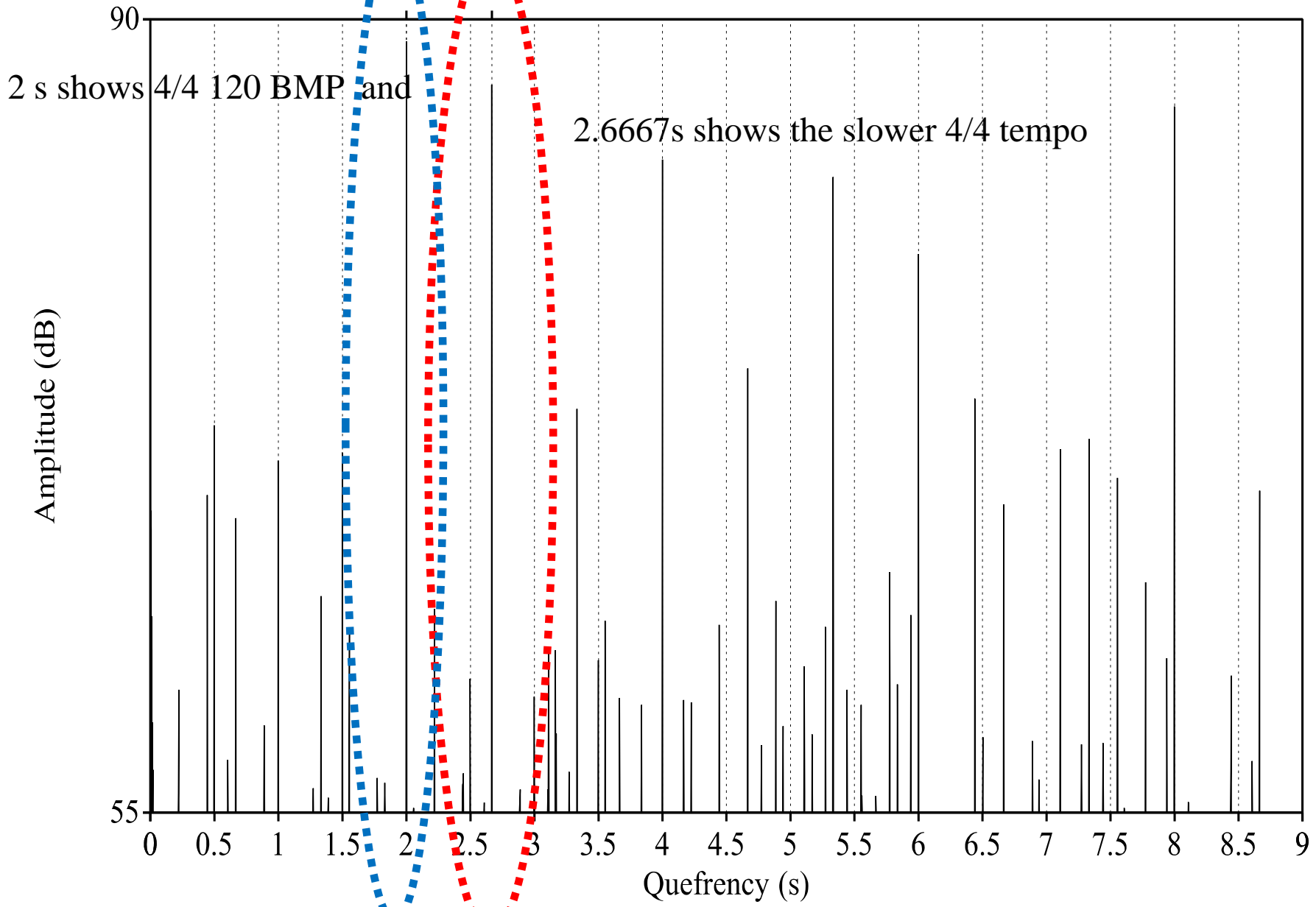
Power Cepstrum. Blue = ch1, Lime = ch2 (Black = Both)

$0.5 \quad 0.5 \times 4/3 = 0.6667$



# CEPSTRUM

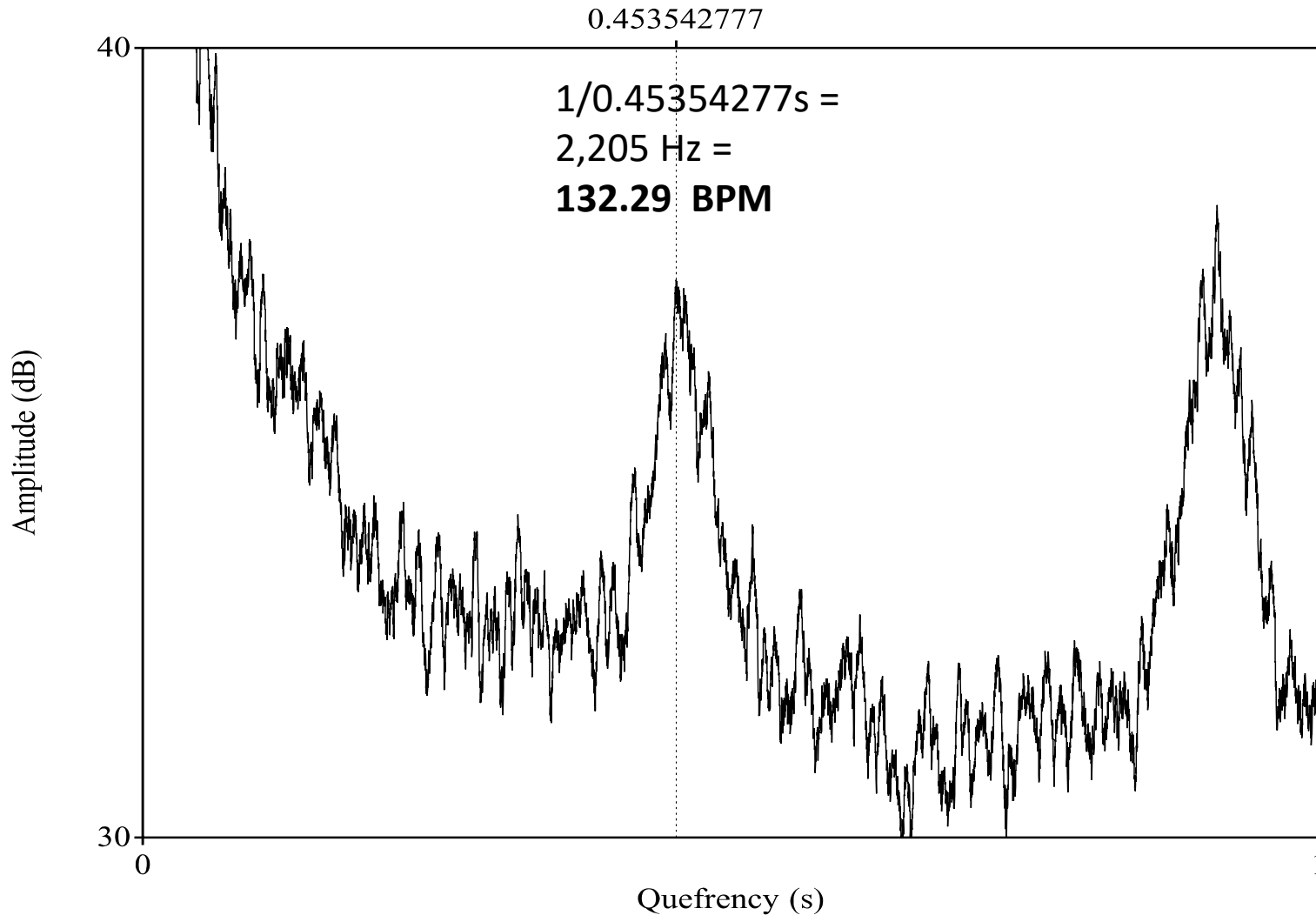
BARS



“Du Kan Godt Få Sitte In’te Mæ Leif”  
(**Got To Get You Into My Life**) Lennon-McCartney  
(arr. + lead guitar: TH for Ballade)



POWER CEPSTRUM (smoothed)



The INTRO has less distinct 4/4,

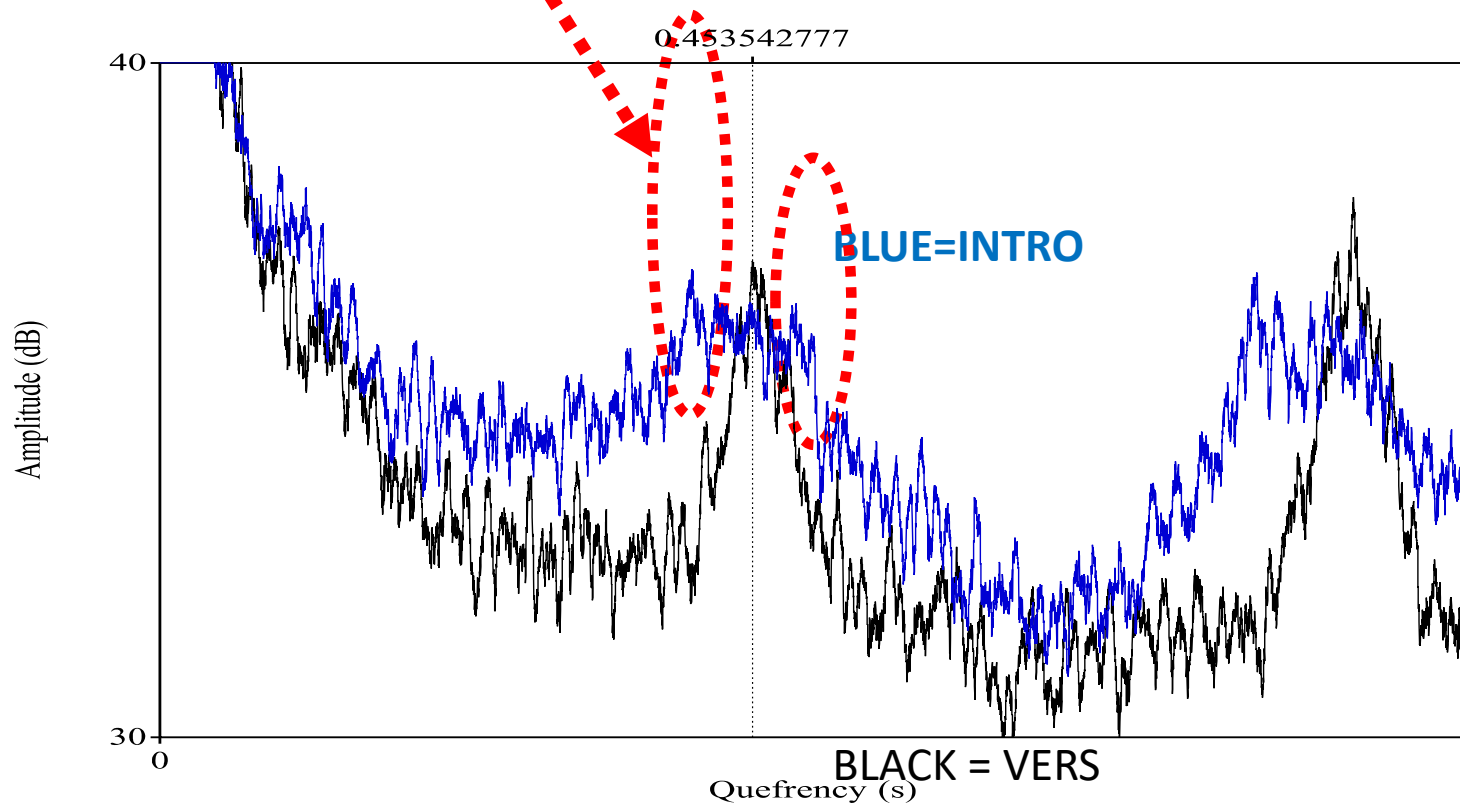
Piano

Musical score for Piano in 4/4 time, featuring complex chords and syncopated rhythms. The score is written in treble and bass clefs. Above the staff, there are various musical notations including accents (^), slurs, and dynamic markings (V). Below the staff, a series of chords are listed: F13, E7#9, D7#11, Dbmaj9, C7#9, H9#11, Bb13, Gb13#11, and F13.

and we see more of the off-beats and syncopations in the Cepstrum:



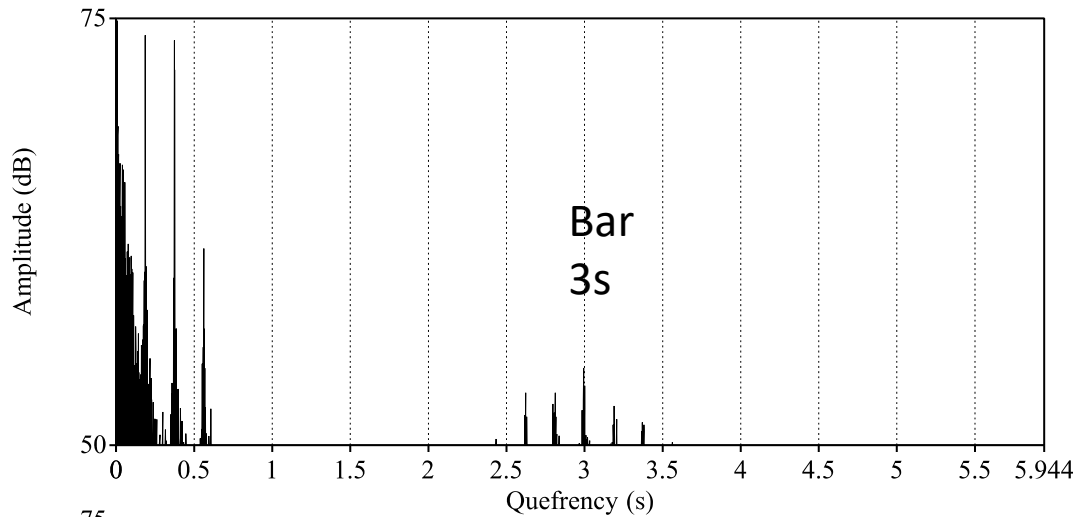
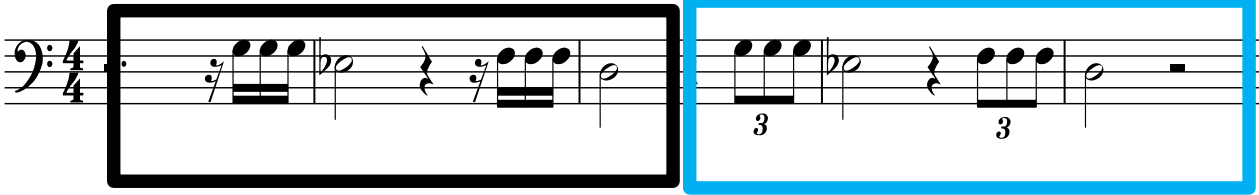
POWER CEPSTRUM (smoothed)



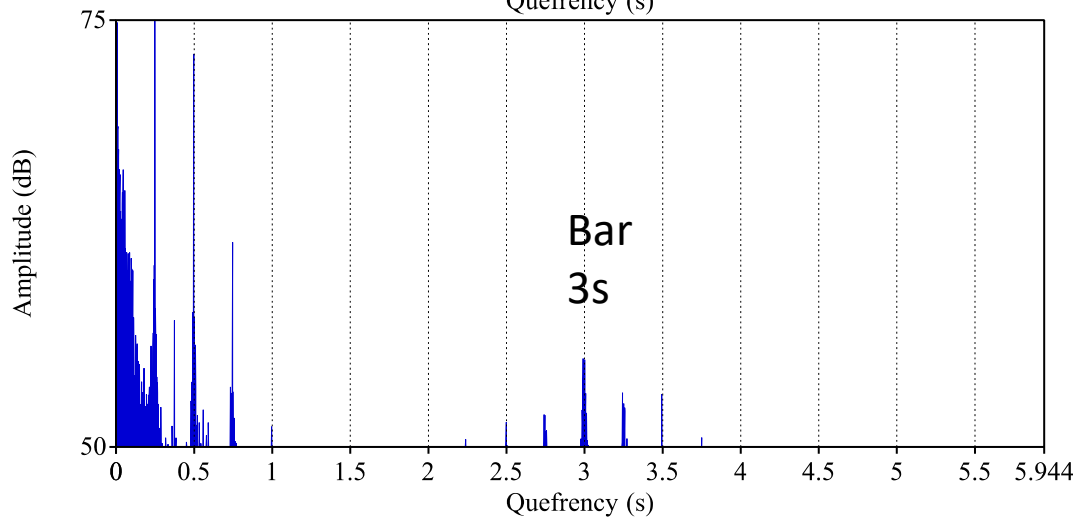
# Beethoven 5th

♩=80

Piano

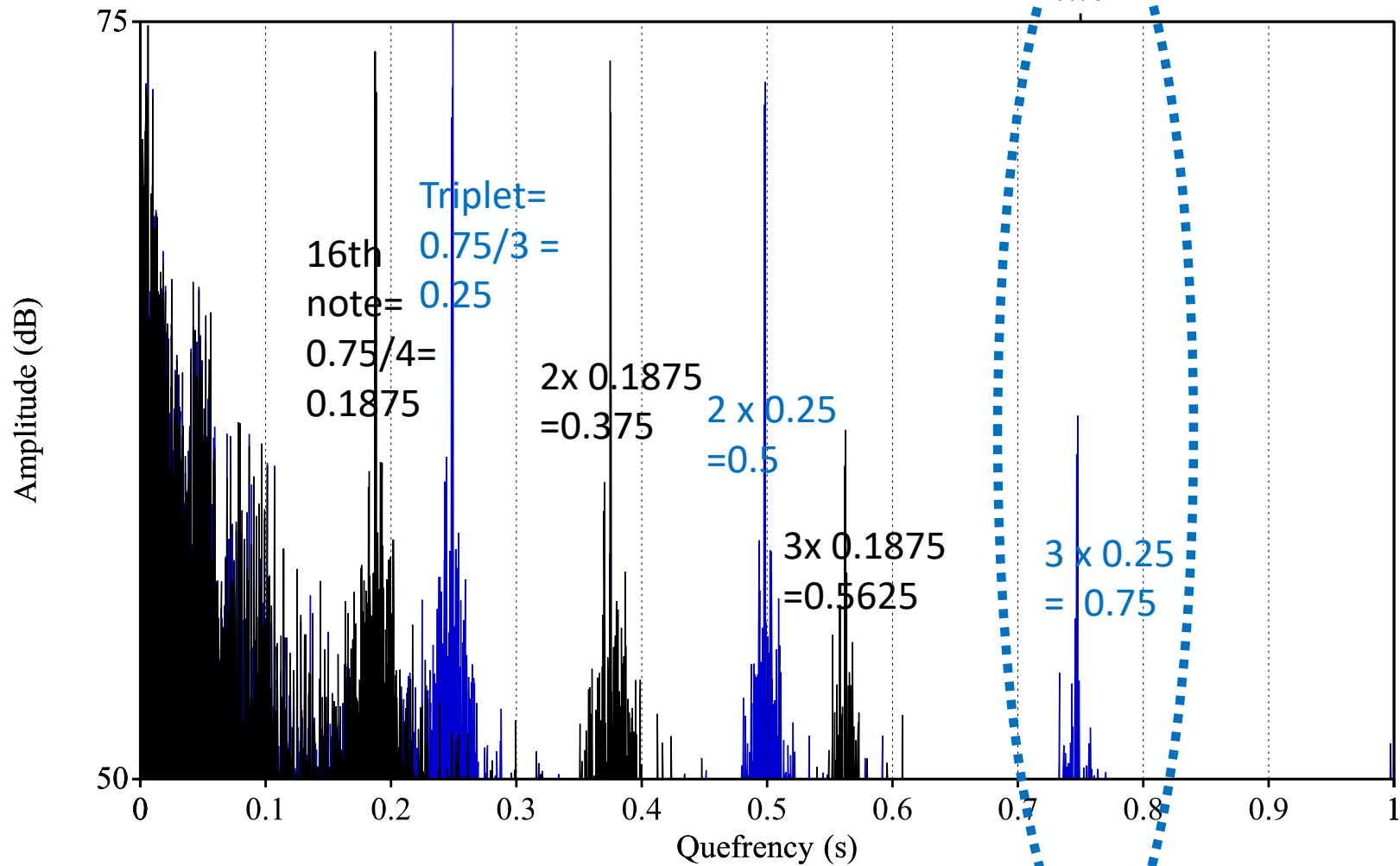


80 BMP=1.3333Hz=0,75 s  
4/4: Bar= 4x0.75 = 3s  
16<sup>th</sup> = 0.75/4=0.1875  
Triplet= 0.75/3 = 0.25





Only the “false” version, (with triplets)  
gives the correct Beat value (80 BPM)



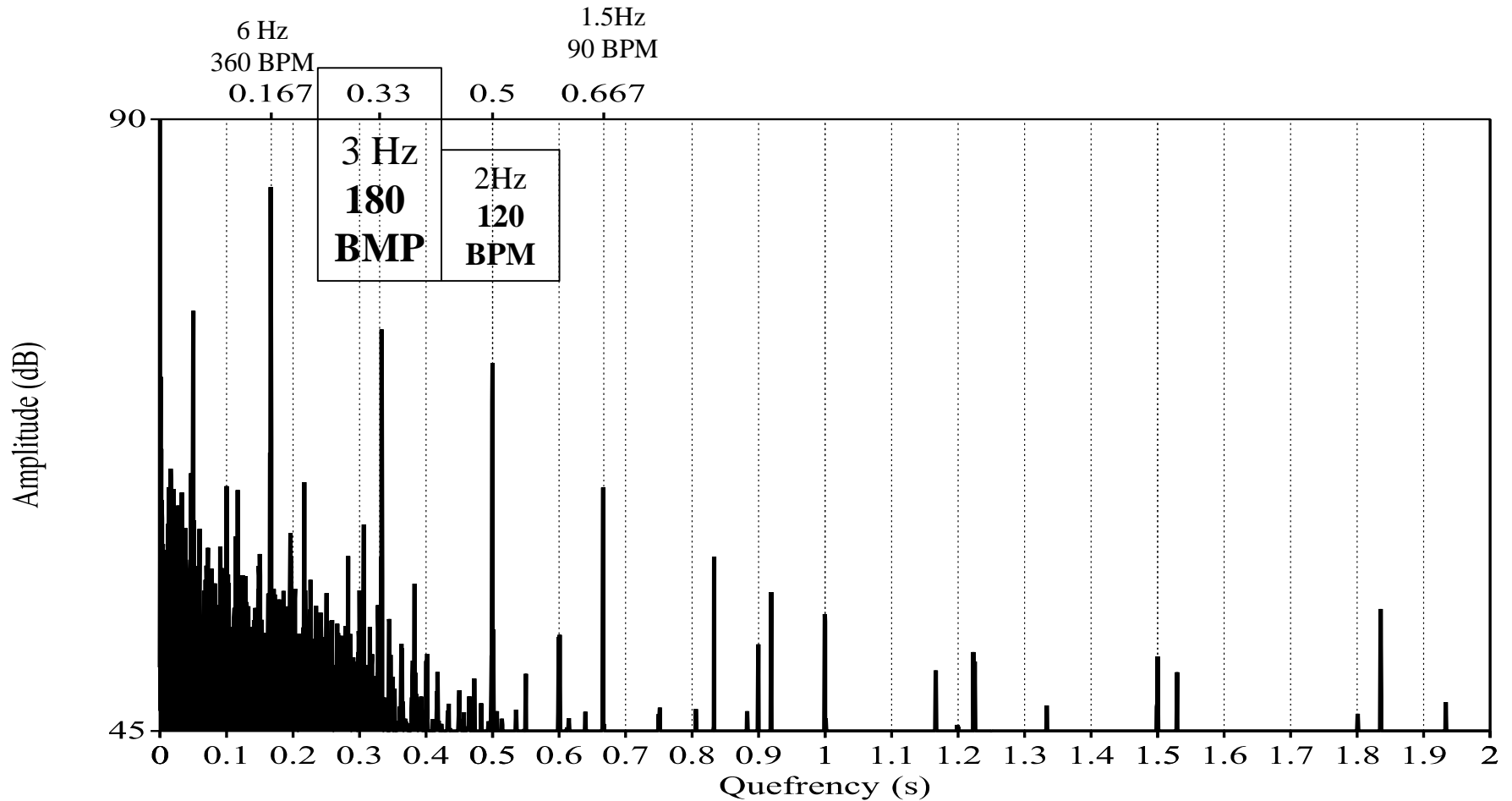
Tor Halmrast: "FLUTR"

25 ch electroacoustic

(4 Quadro + 20 Ambisonics + sub



## POWER CEPSTRUM

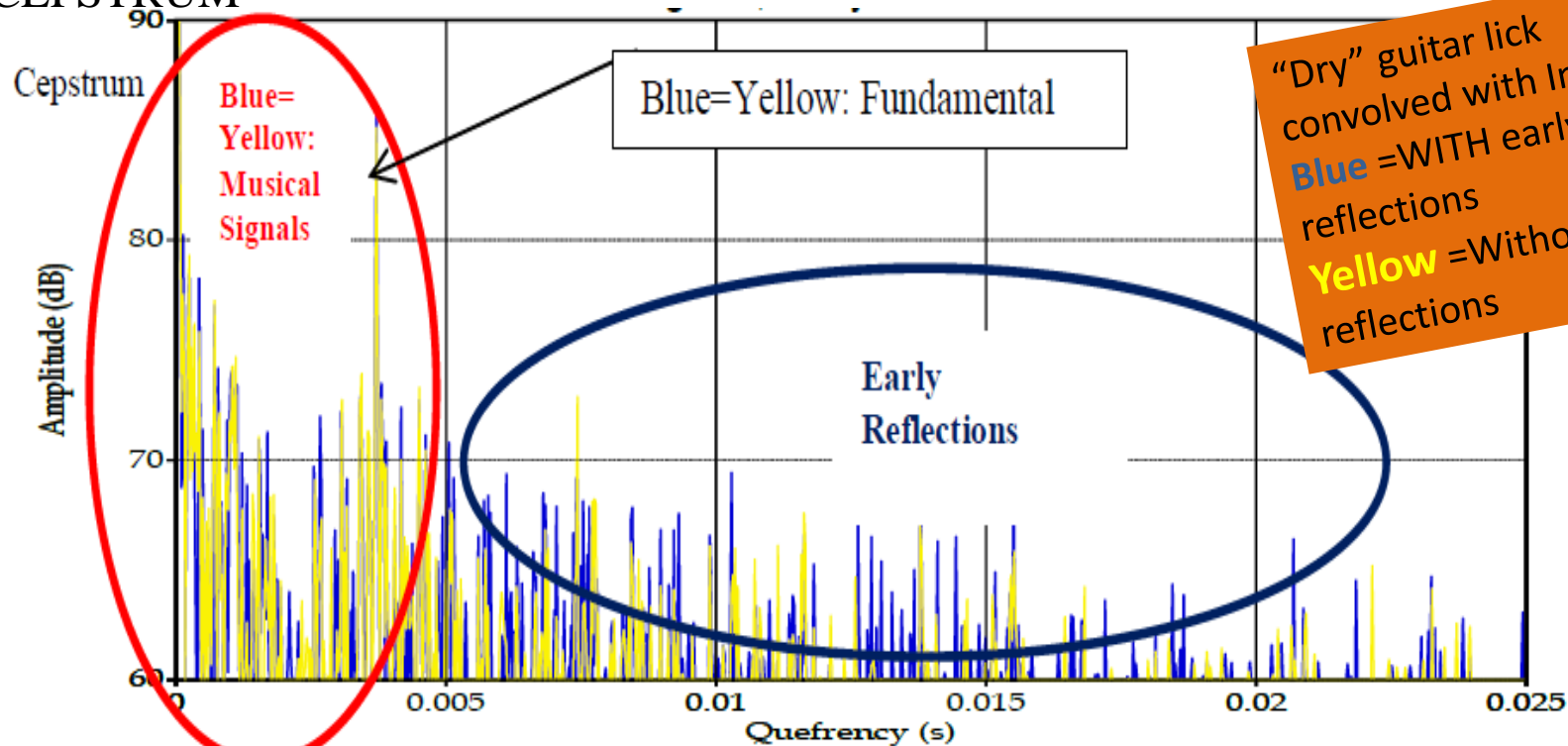


# Can we detect

# EARLY REFLECTIONS/ “INTIMACY”

## directly from recorded music?

CEPSTRUM



Simple test (and we knew the answer), but:

With info about the lowest fundamental(s) of the music recorded, it should be possible to get an indication of any early reflections directly from the recorded music.



Free download from:

[www.tor.halmrast.no](http://www.tor.halmrast.no)

Some Chapters are translated to English