

# Auditory Representation

**Wu Xihong**

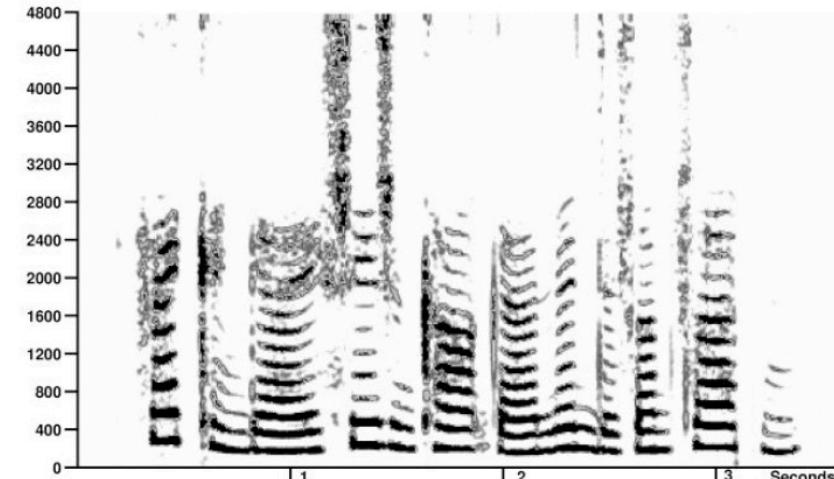
School of Artificial Intelligence

# Computational Goals in Audition

- Orient to sounds
- Identify sounds
- Communication

## Different points from visual perception:

- wavelength
- sound objects



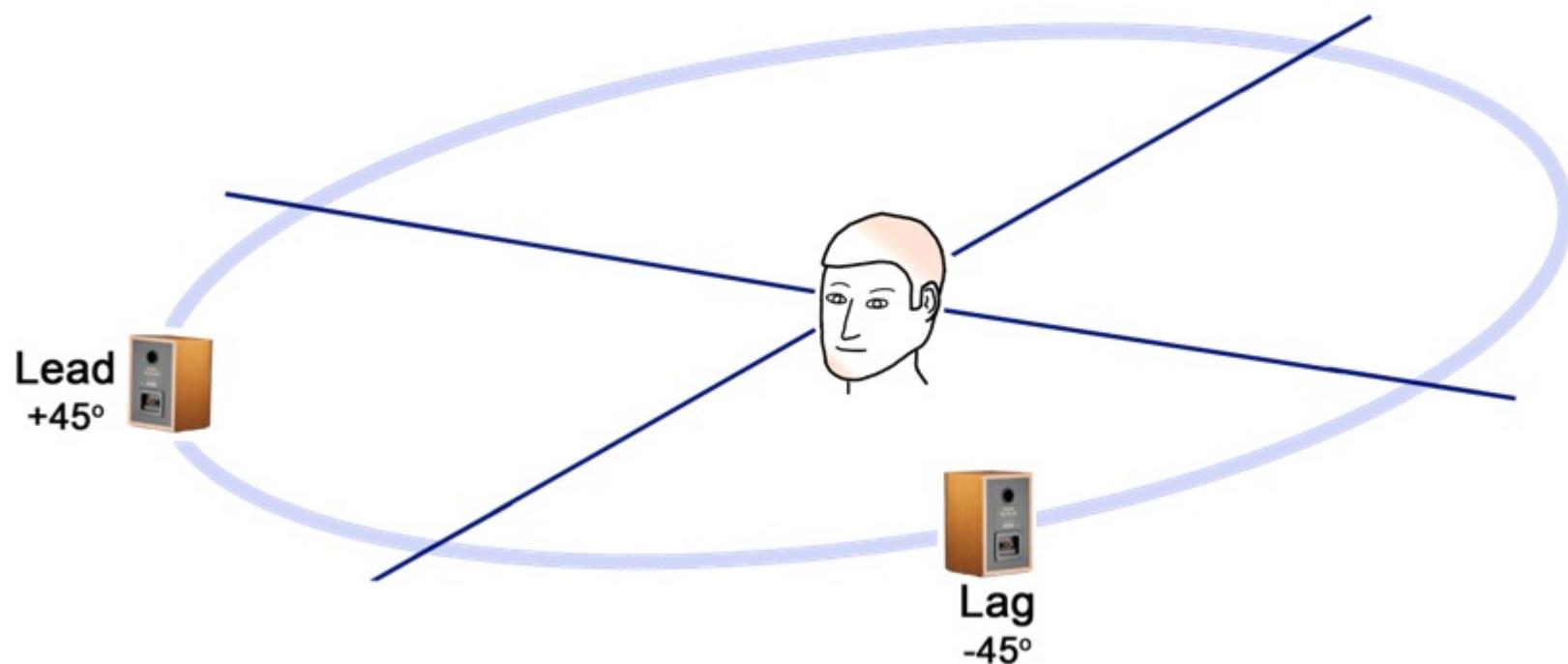
## What makes these hard in a natural environment

- background noise
- multiple sounds
- environmental reflection

- Auditory representation
- Pitch and timbre of speech and music
- Auditory scene analysis
  - Where
    - sound source localization
  - What
    - speech separation
- Speech Perception

# Some examples:

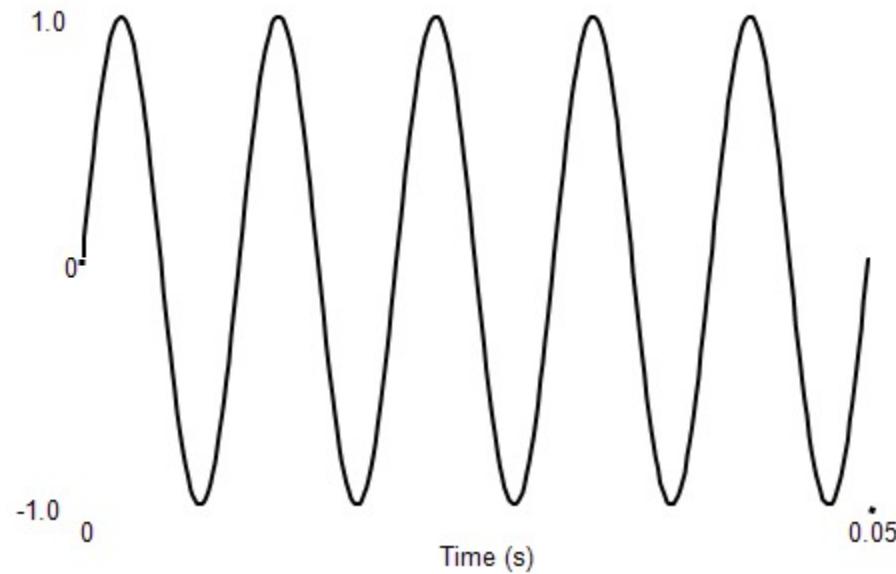
- Precedence effect
- Headphone, recording
- Nonlinear system



# Applications

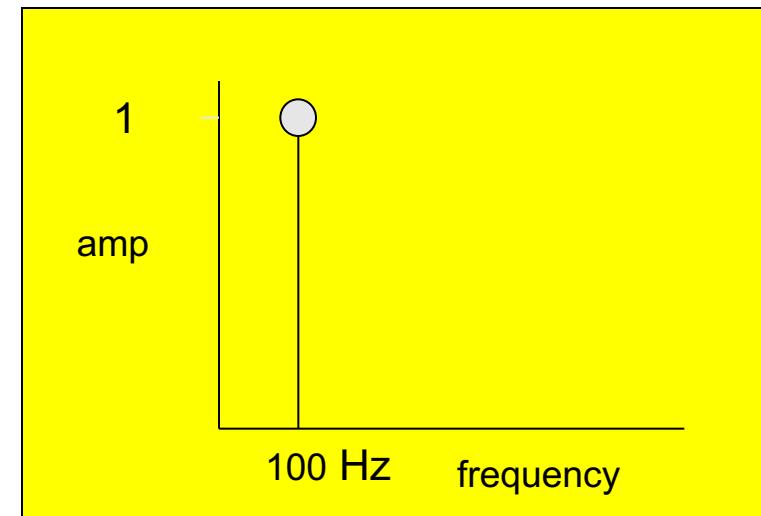
- Environmental surveillance
- Music codec
- Virtual 3D audio
- music retrieval
- Machine speech recognition, speech translation, human-machine dialog
- Hearing rehabilitation

# Frequency: 100-Hz Sine Wave

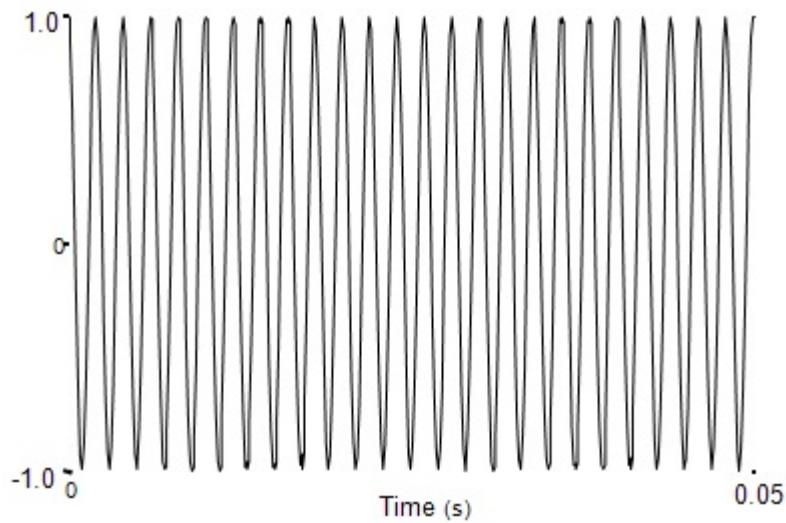


Waveform  
Amplitude against time

Spectrum  
Amplitude against frequency



# Frequency: 500-Hz Sine Wave

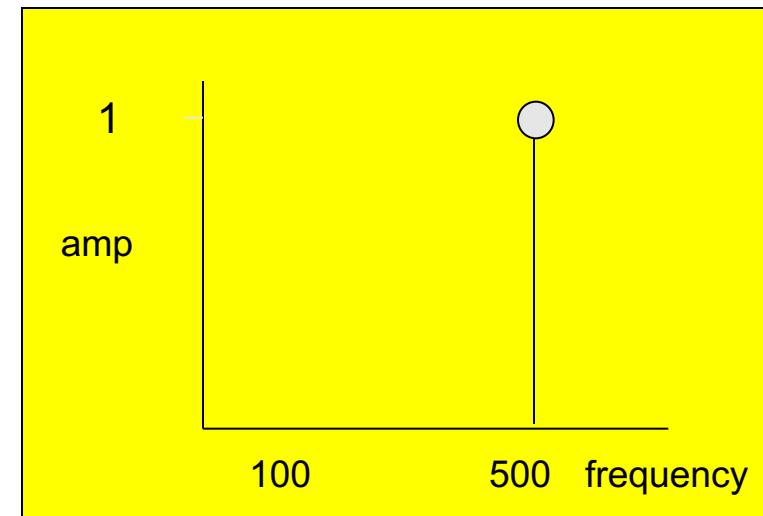


Waveform

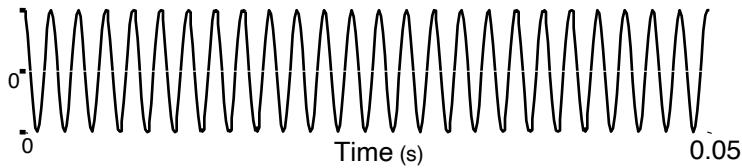
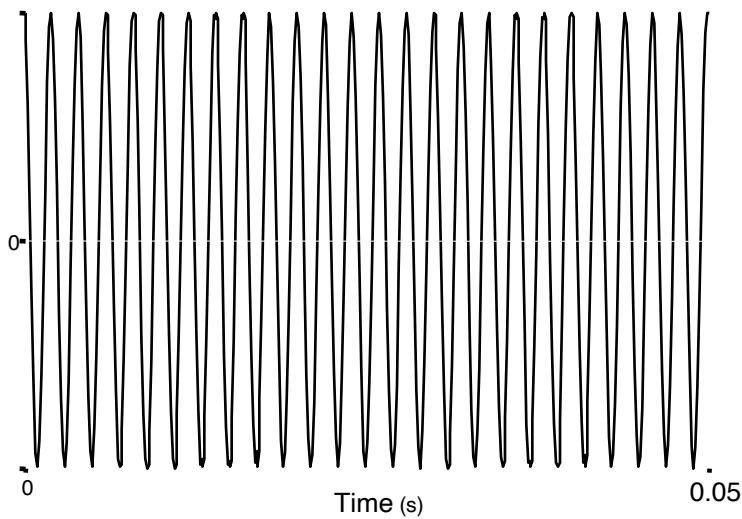
Amplitude against time

Spectrum

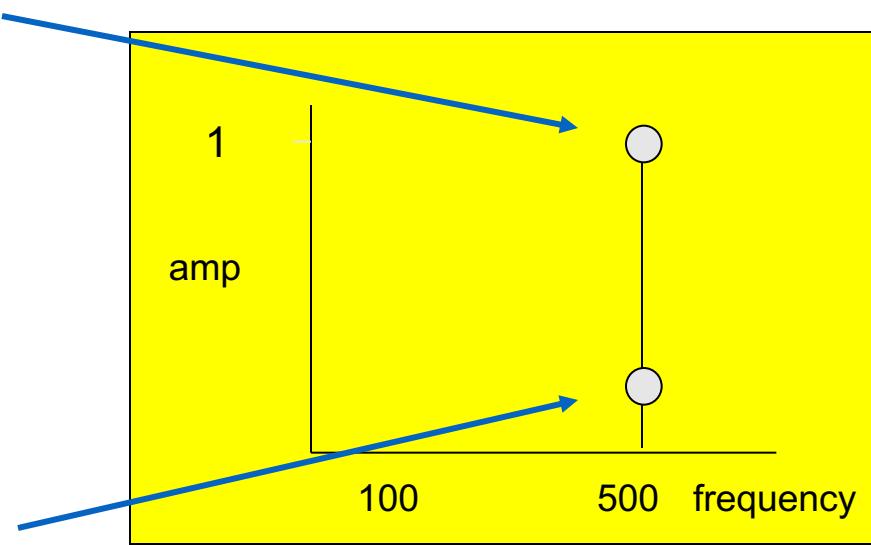
Amplitude against frequency



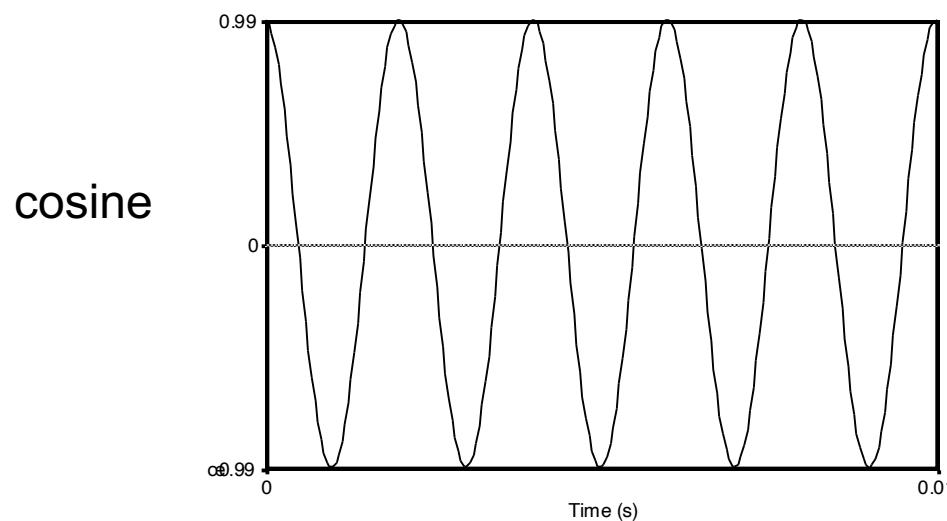
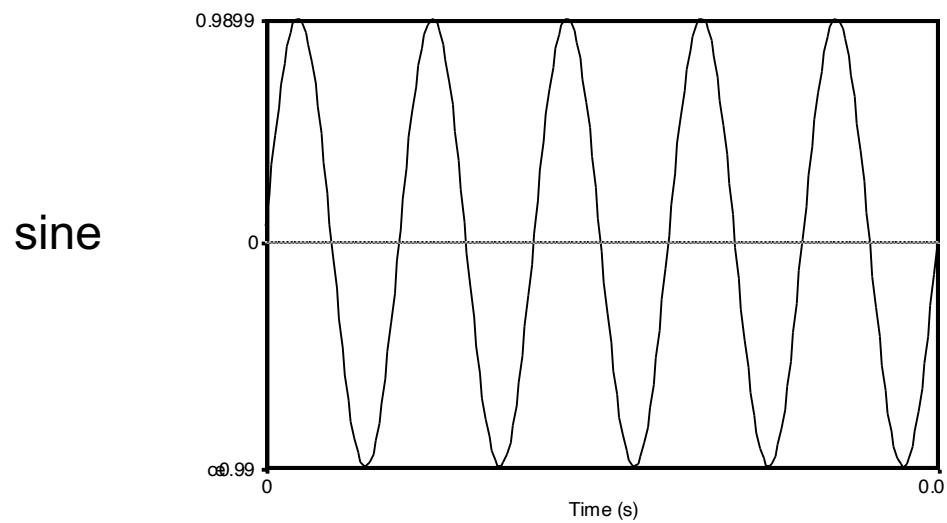
# Amplitude: 500-Hz Sine Wave



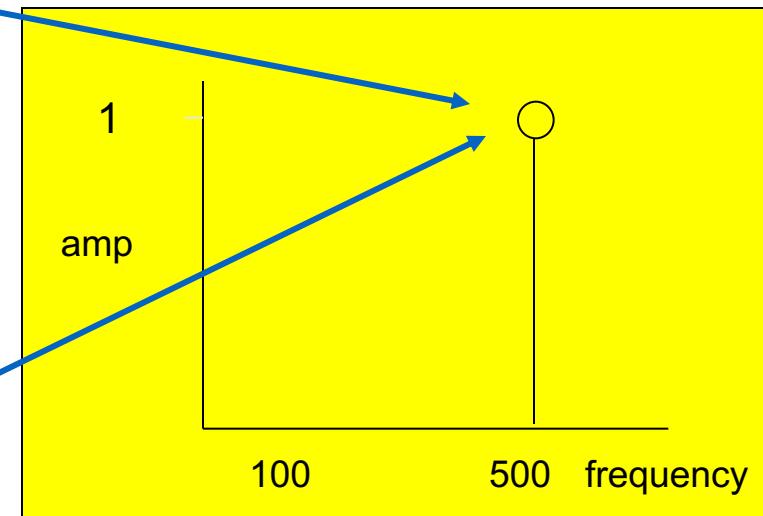
Spectrum  
Amplitude against frequency



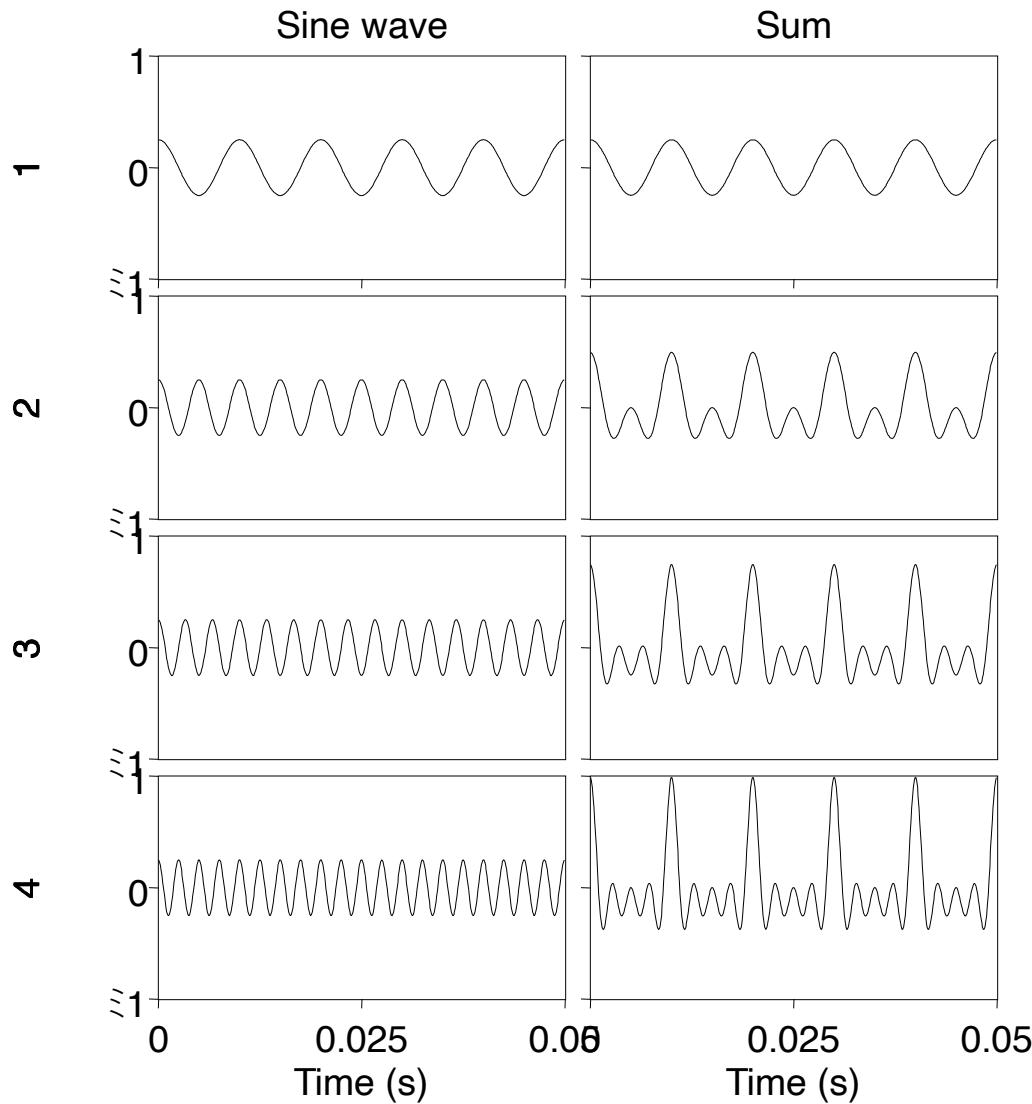
# Phase: 500-Hz Sine Wave



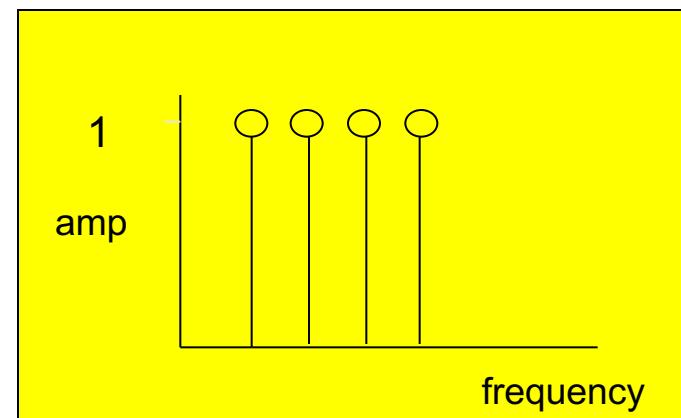
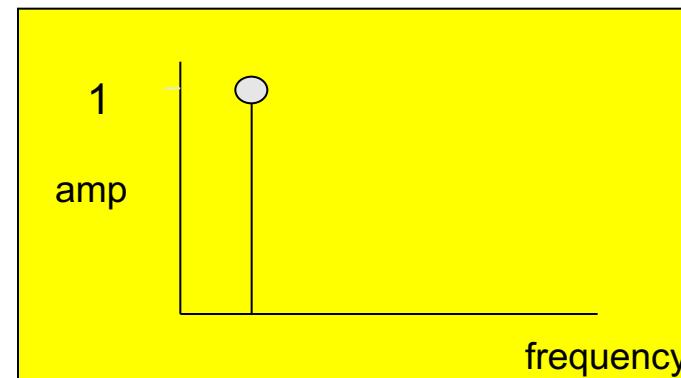
The amplitude spectrum does not show phase



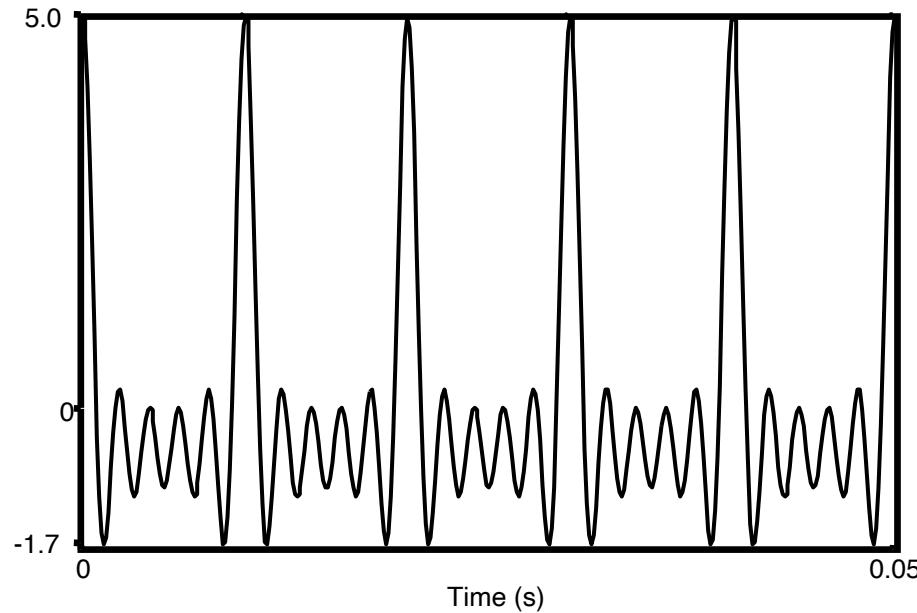
# adding sine waves



Spectrum of Sum



# 100-Hz fundamental Complex Wave

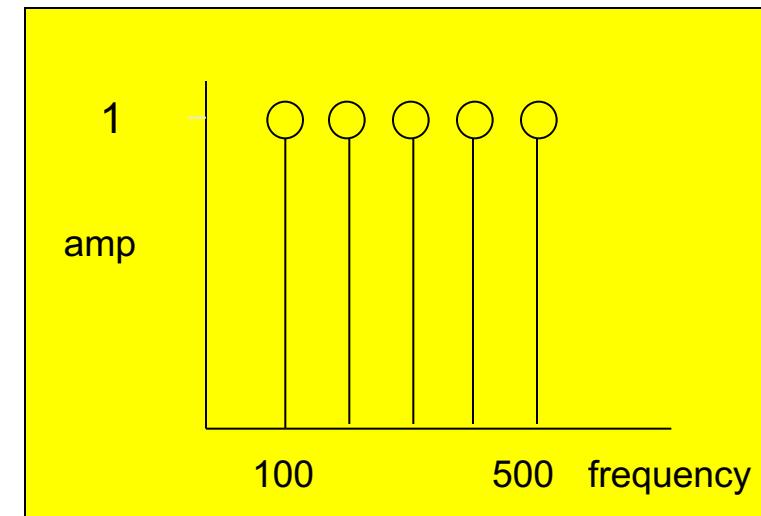


Waveform

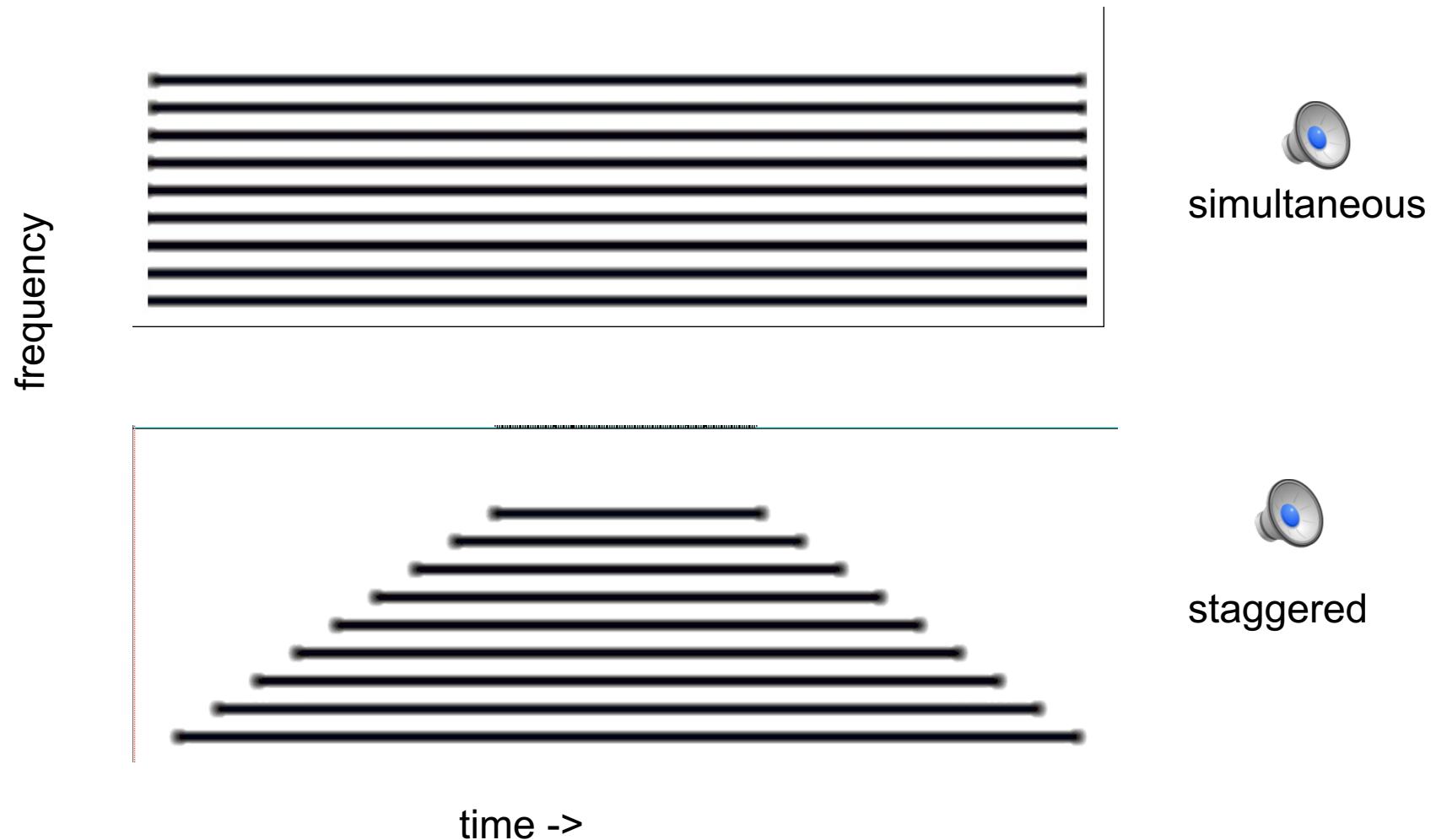
Amplitude against time



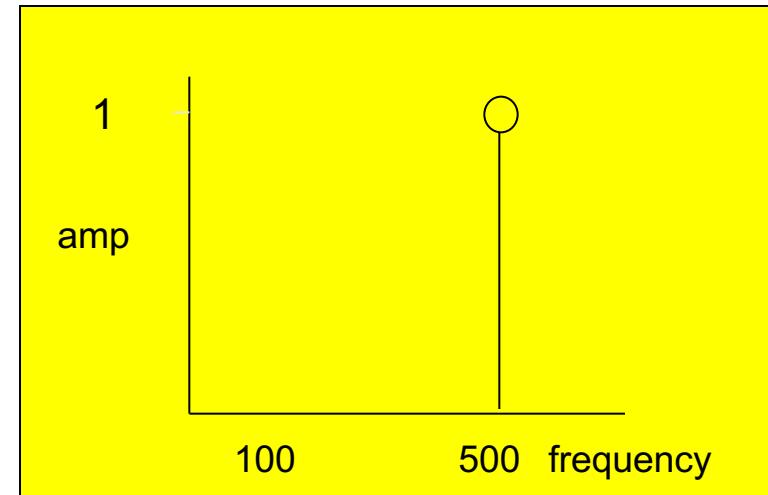
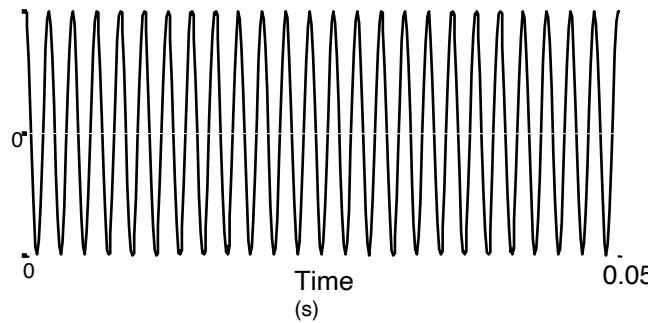
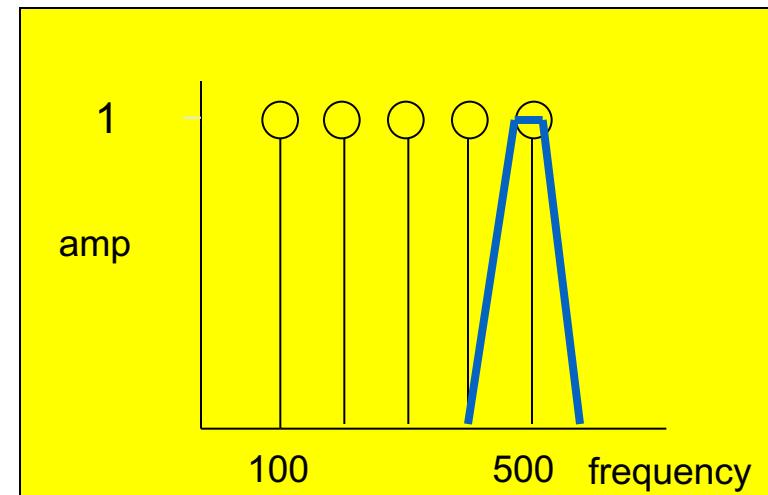
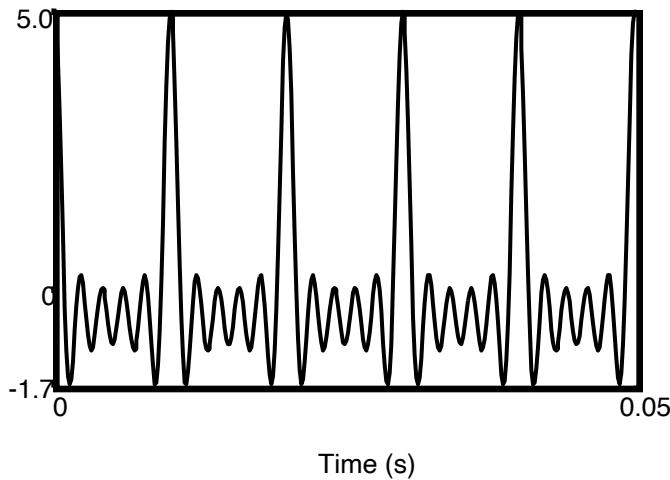
Spectrum Amplitude against frequency



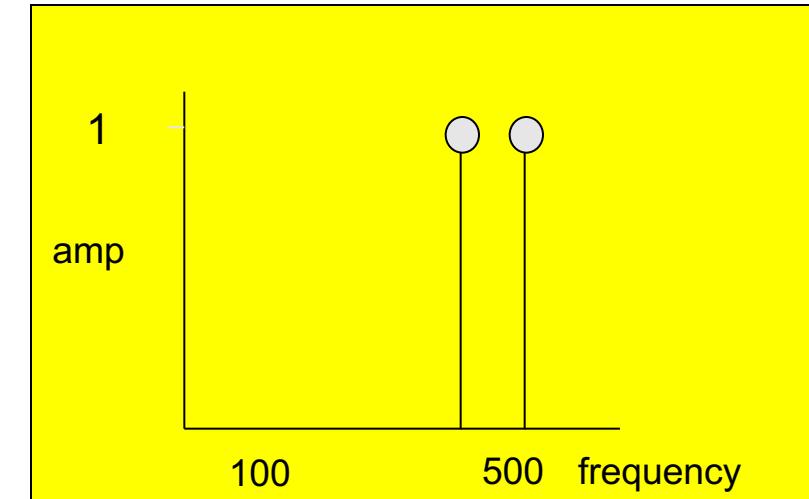
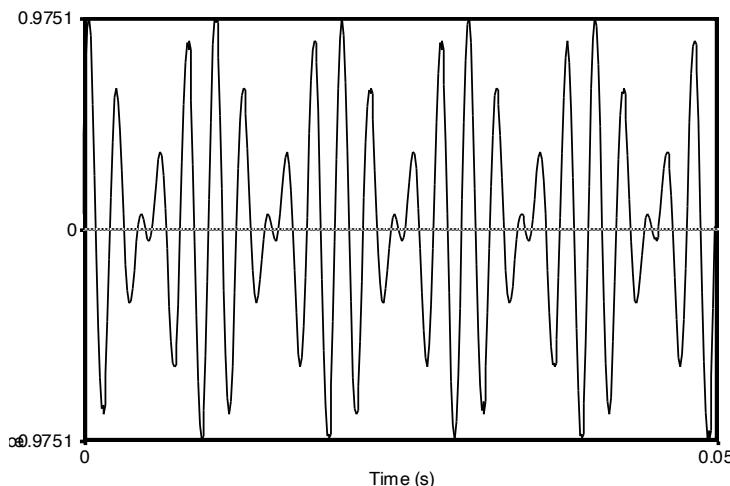
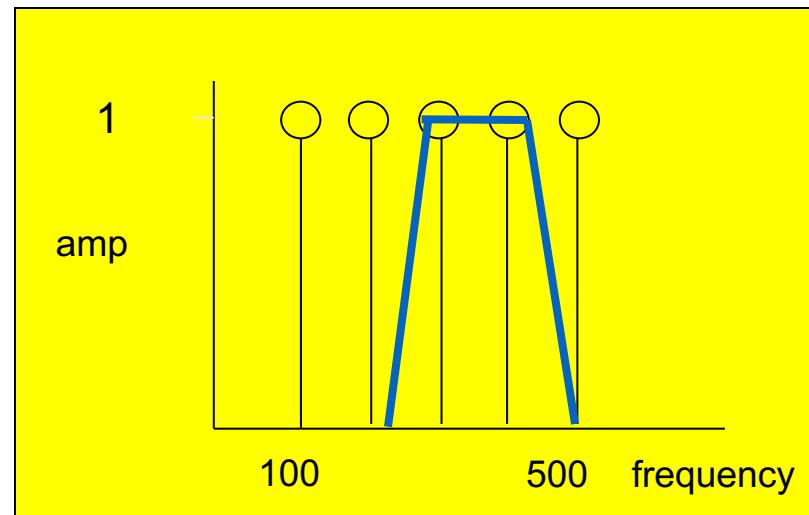
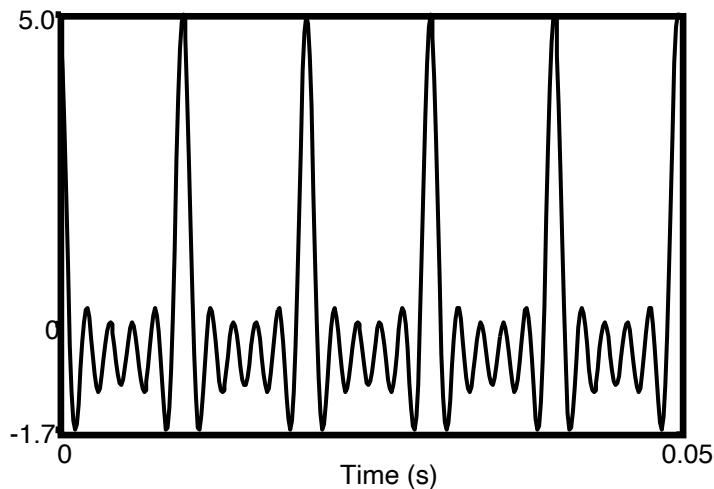
# Staggered sine-waves adding



# Bandpass filtering (narrow)



# Bandpass filtering (wide)

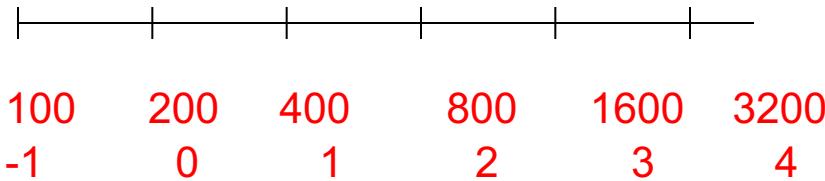


# The linear vs log scales

Linear: equal distances  
represent equal differences



Log: equal distances  
represent equal ratios



e.g. Piano keyboard frequencies

**Octave** = doubling of frequency

# deciBel (dB) scale

Sound A is x dB more intense than sound B when:

$$x = 10 \cdot \log_{10} (\text{energy of A} / \text{energy of B})$$

or      $x = 20 \cdot \log_{10} (\text{amp of A} / \text{amp of B})$

So if A is 20 watts and B is 10 watts

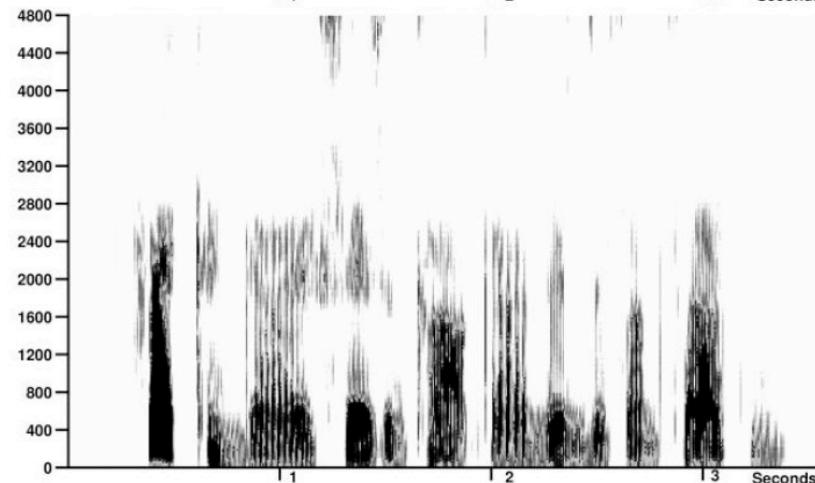
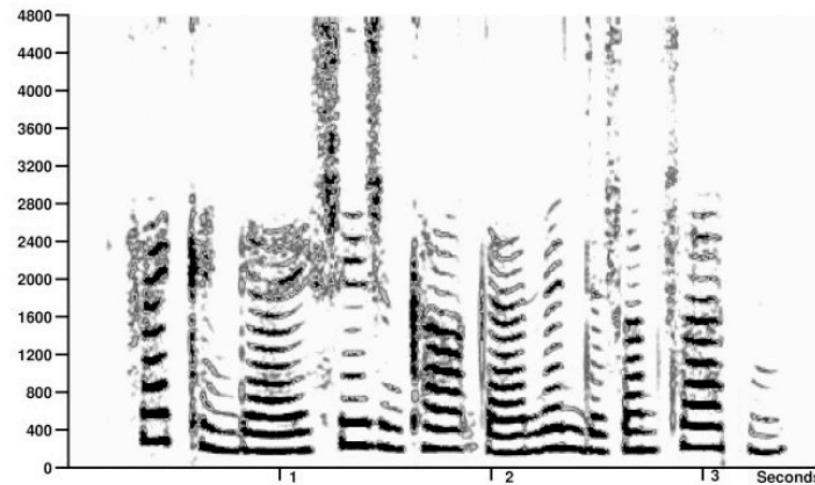
$$x = 10 \cdot \log_{10} (20/10) = 10 \cdot 0.3 = 3 \text{dB}$$

You can usually just hear a difference of 1dB (jnd)

# Relative Amplitudes and Decibels for Environmental Sounds

SOUND	RELATIVE AMPLITUDE	DECIBELS (DB)
Barely audible (threshold)	1	0
Leaves rustling	10	20
Quiet residential community	100	40
Average speaking voice	1,000	60
Express subway train	100,000	100
Propeller plane at takeoff	1,000,000	120
Jet engine at takeoff (pain threshold)	10,000,000	140

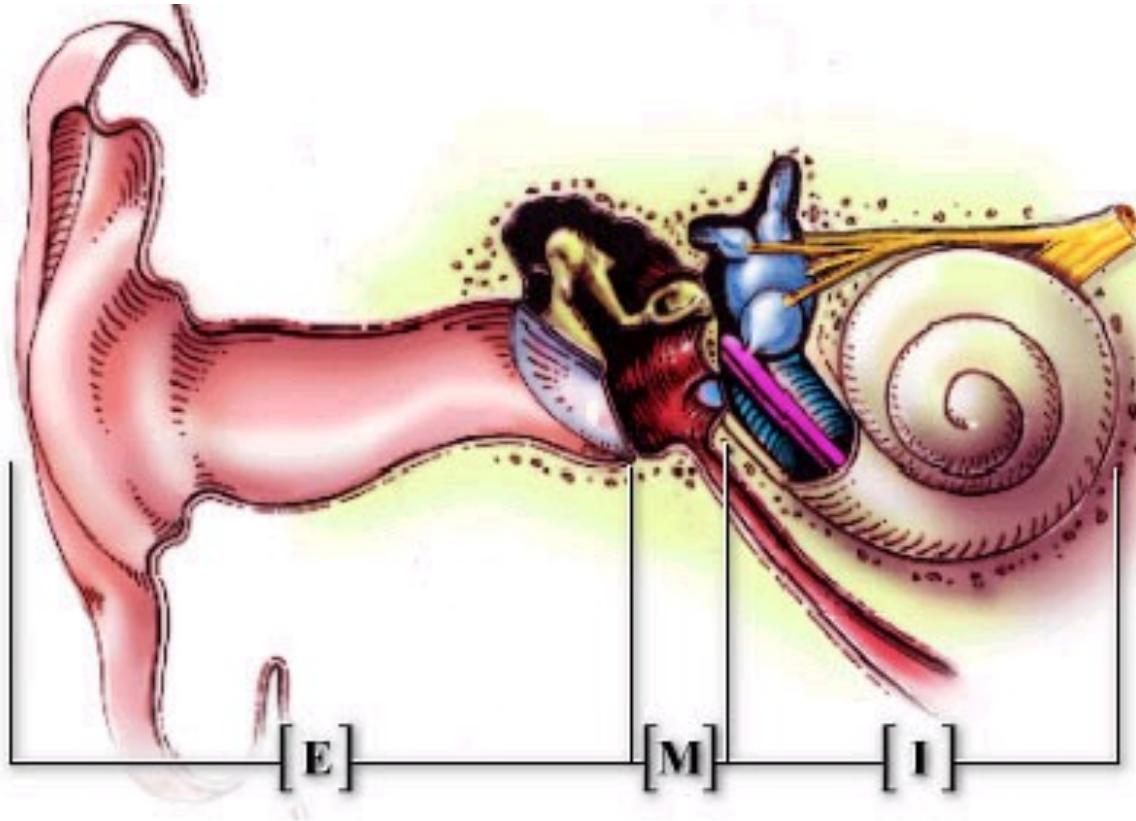
# What auditory structure should be represented?



Conventional spectrograms of speech:

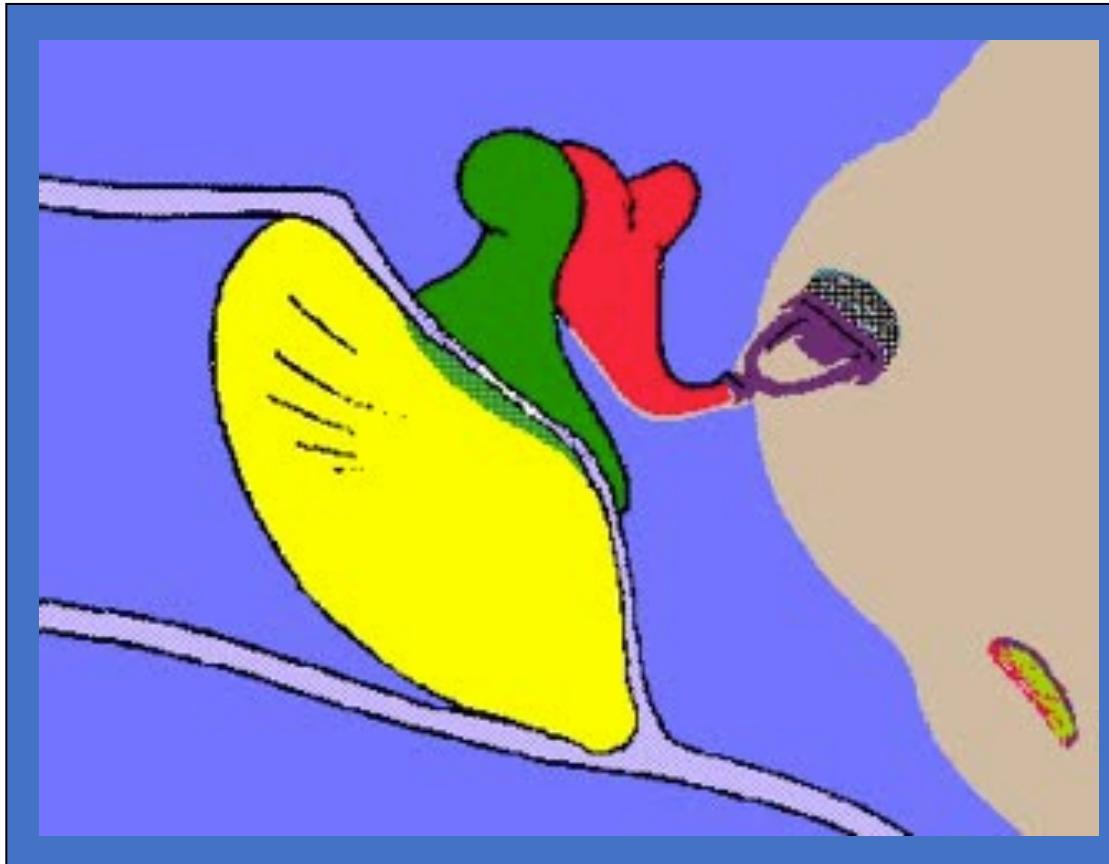
- upper time window: 20Hz
- lower time window: 200Hz

# Overview of Human Ear



- 1) Capture; 2) Amplify mid-freqs; 3) Vertical direction coding

# The Ossicular Chain

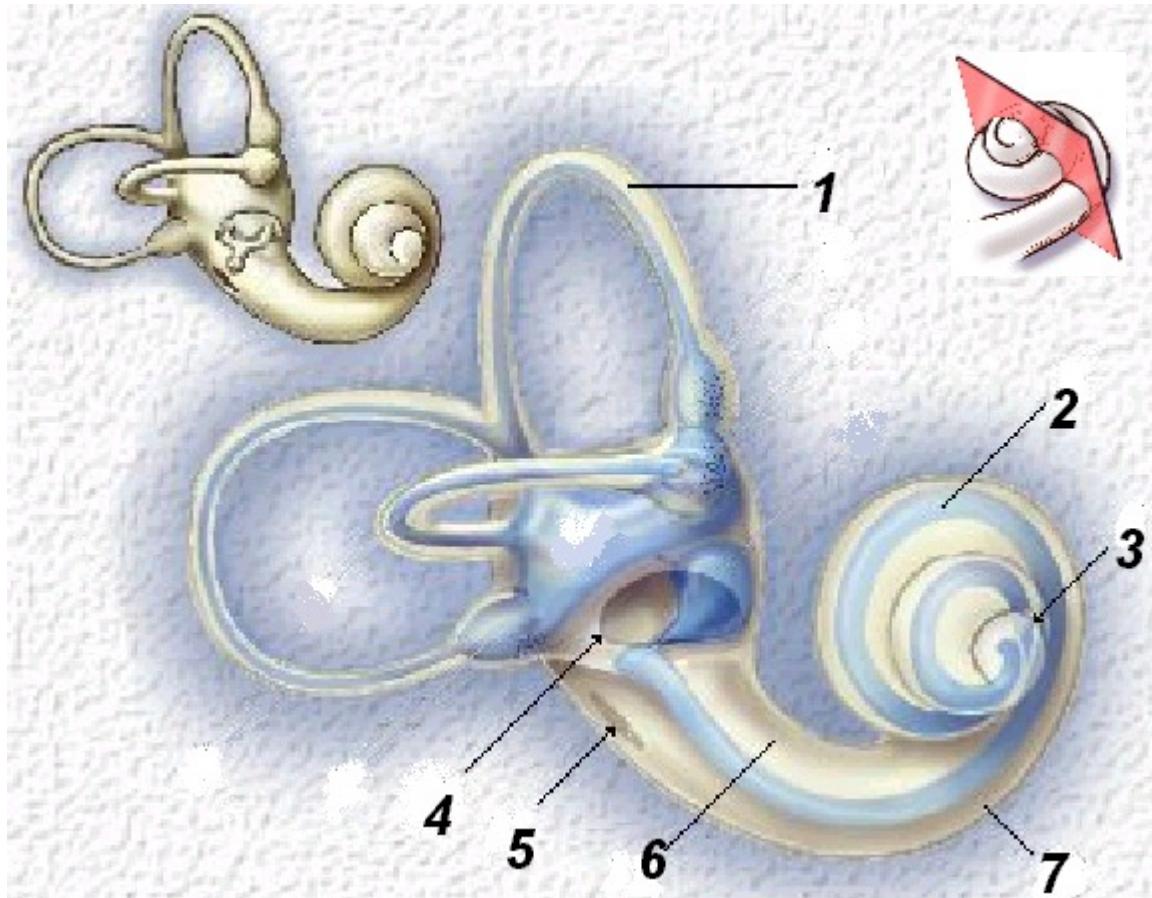


- 1) Protection; 2) Impedance match

# Conductive hearing loss

- Sounds don't get into cochlea
- Middle ear problems
- Helped by surgery and by amplification

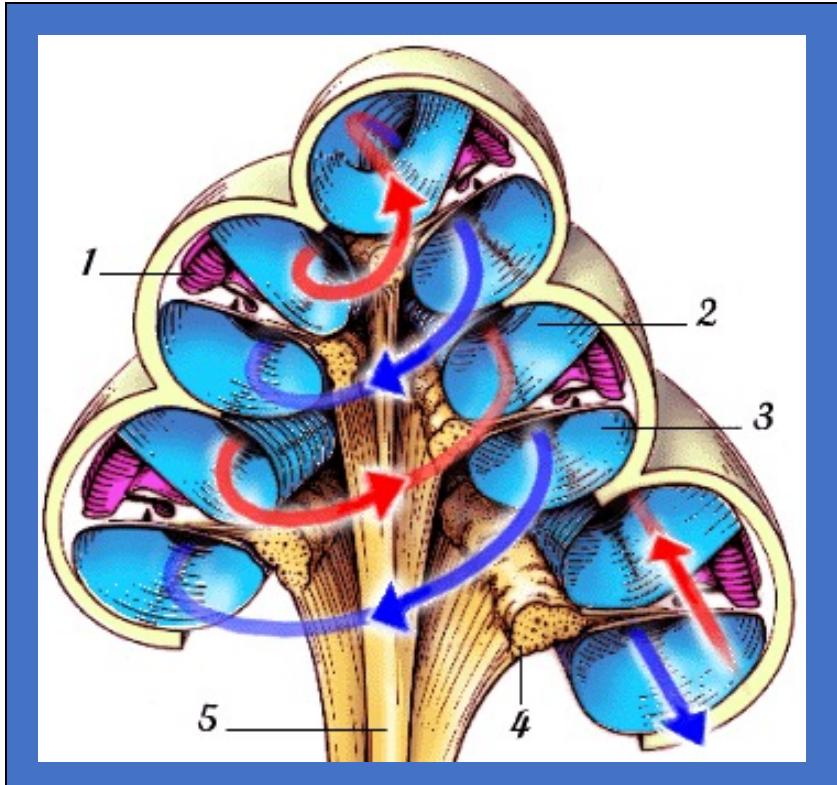
# The Inner Ear



1. 1/2 circular canal
2. Cochlear duct
3. helicotrema
4. oval window
5. round window
6. scala vestibuli
7. scala tympani

Frequency analysis; Transduction

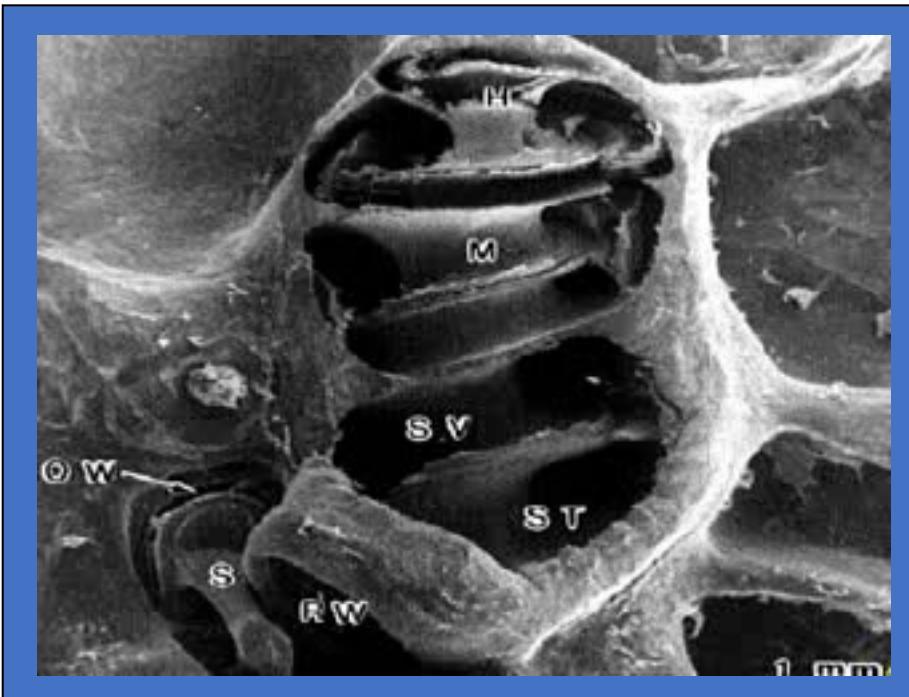
# Cross Section of the Cochlea.



1. the cochlear duct
2. the scala vestibuli
3. the scala tympani
4. the spiral ganglion
5. auditory nerve fibers

The red arrow is from the oval window,  
the blue arrow points to the round window.

# Cross Section of the Cochlea.

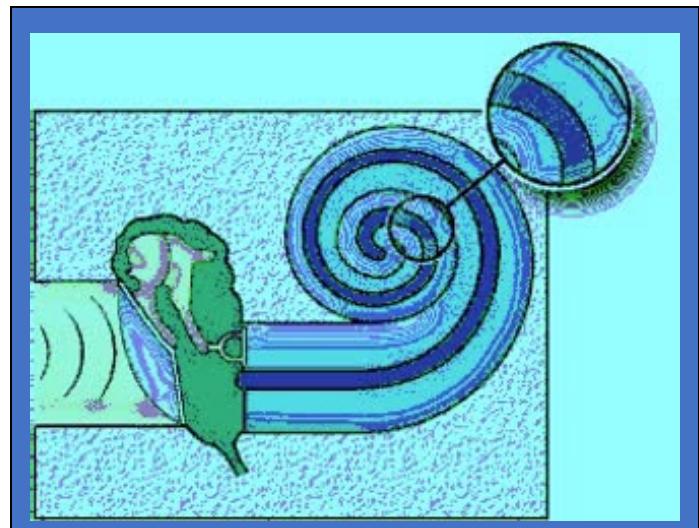


1. the cochlear duct
2. the scala vestibuli
3. the scala tympani
4. the spiral ganglion
5. auditory nerve fibers

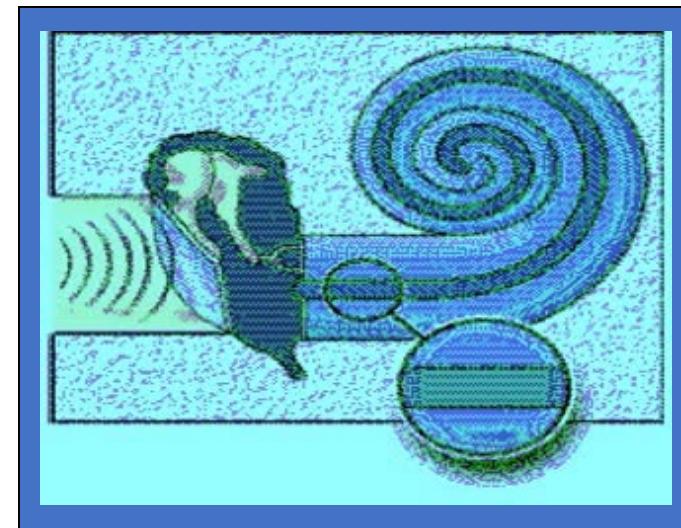
The red arrow is from the oval window,  
the blue arrow points to the round window.

# The Basilar Membrane

Depending on the frequency, the vibration has a maximum resonance at a different point along the basilar membrane.

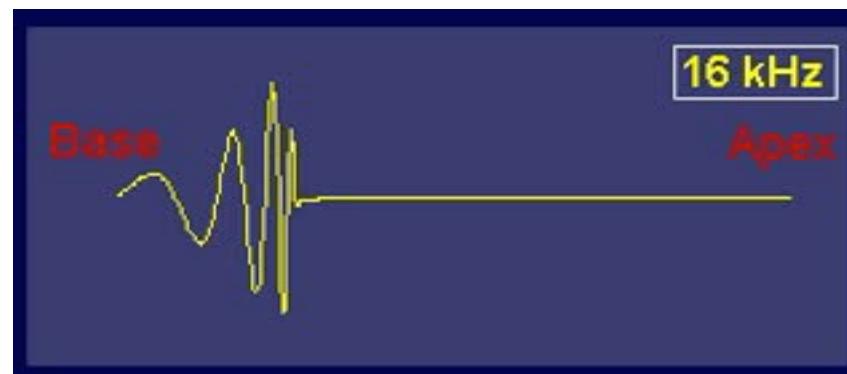
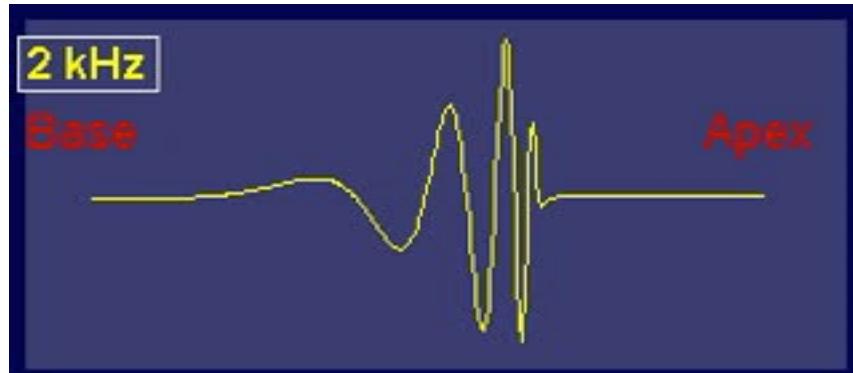
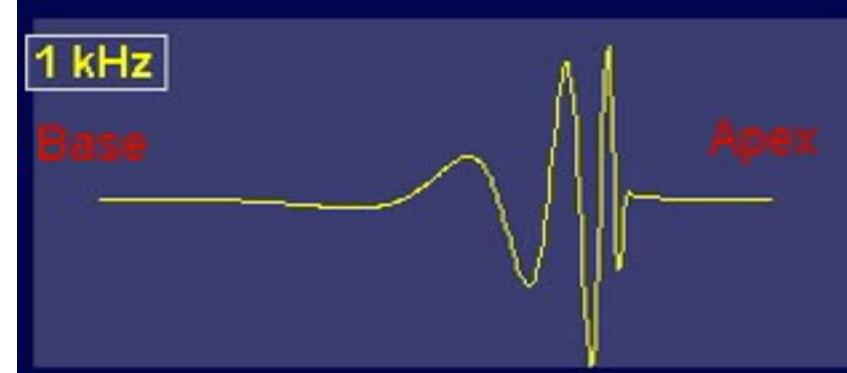
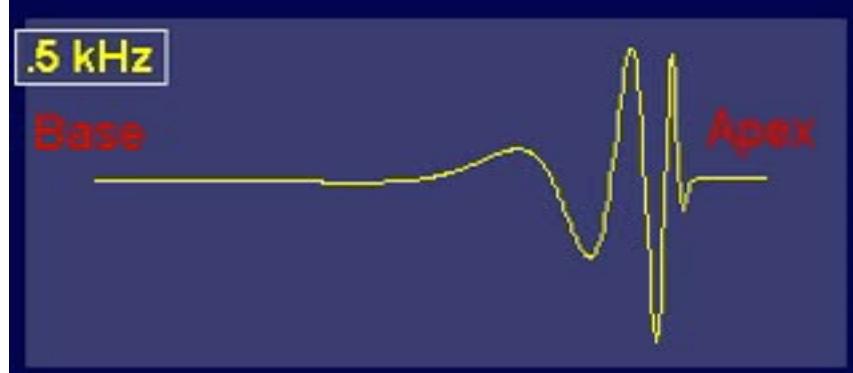


low frequency

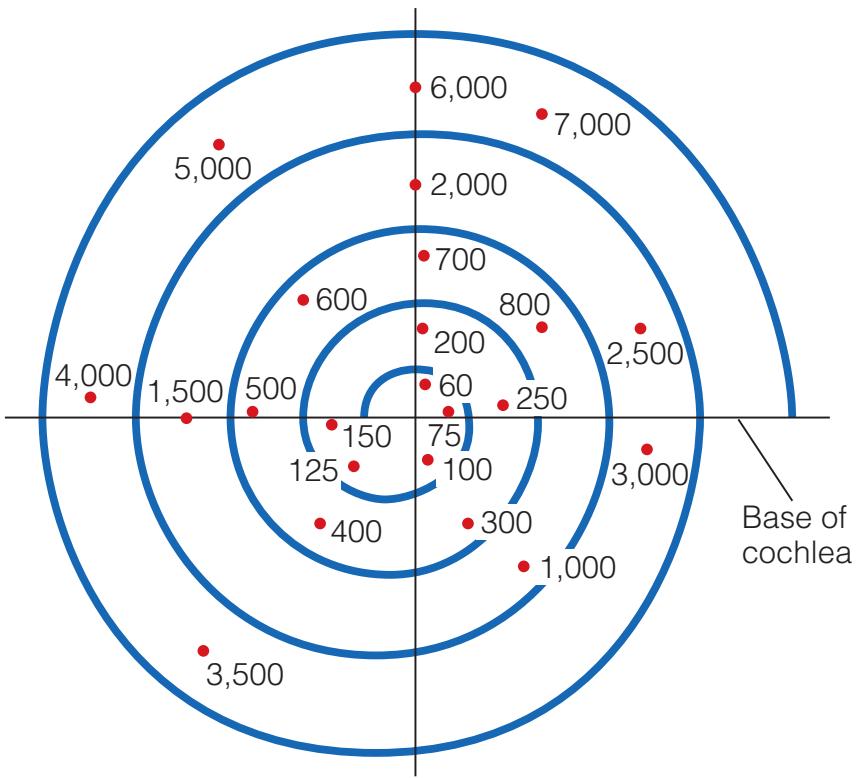


high frequency

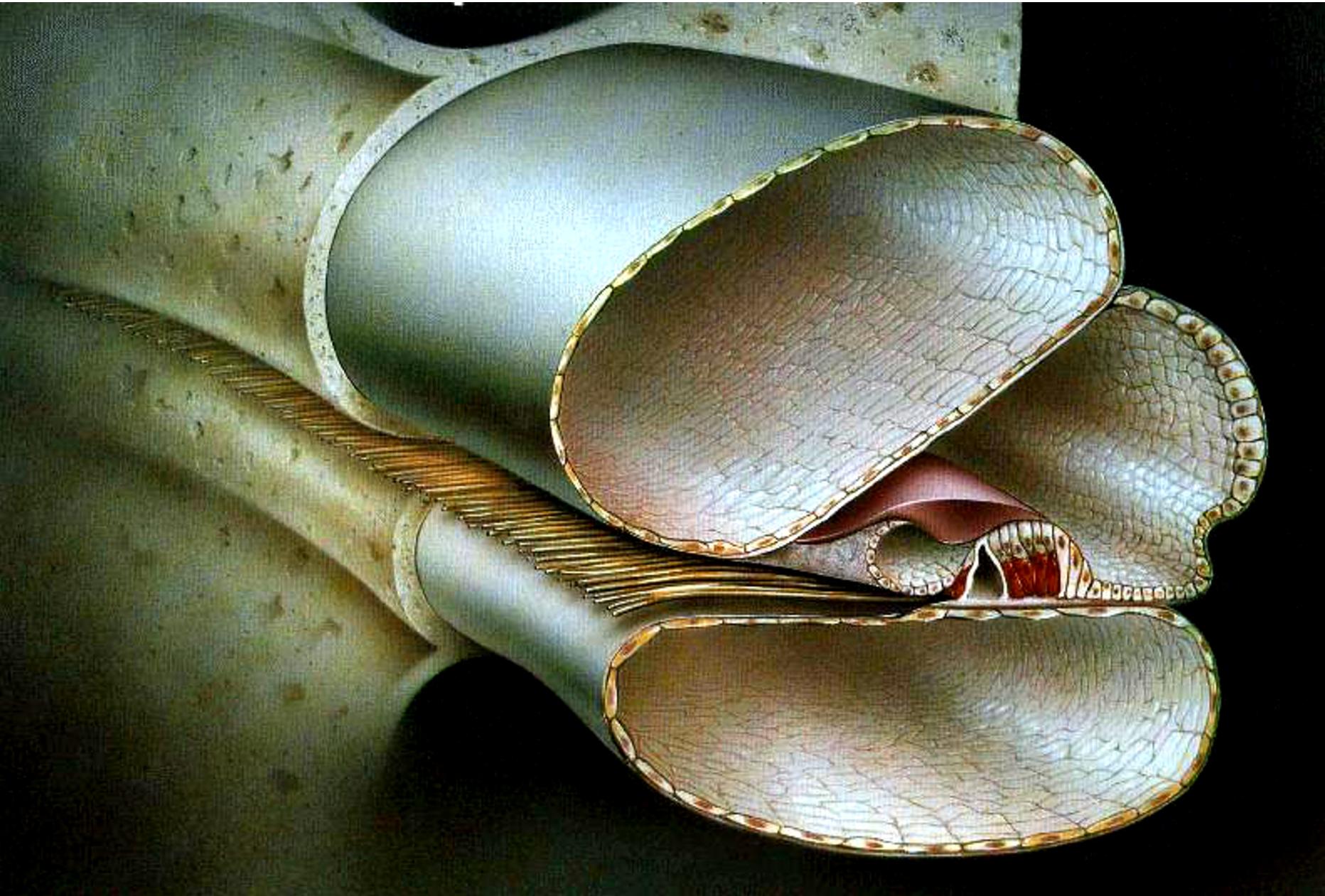
# Traveling Wave on the Basilar Membrane



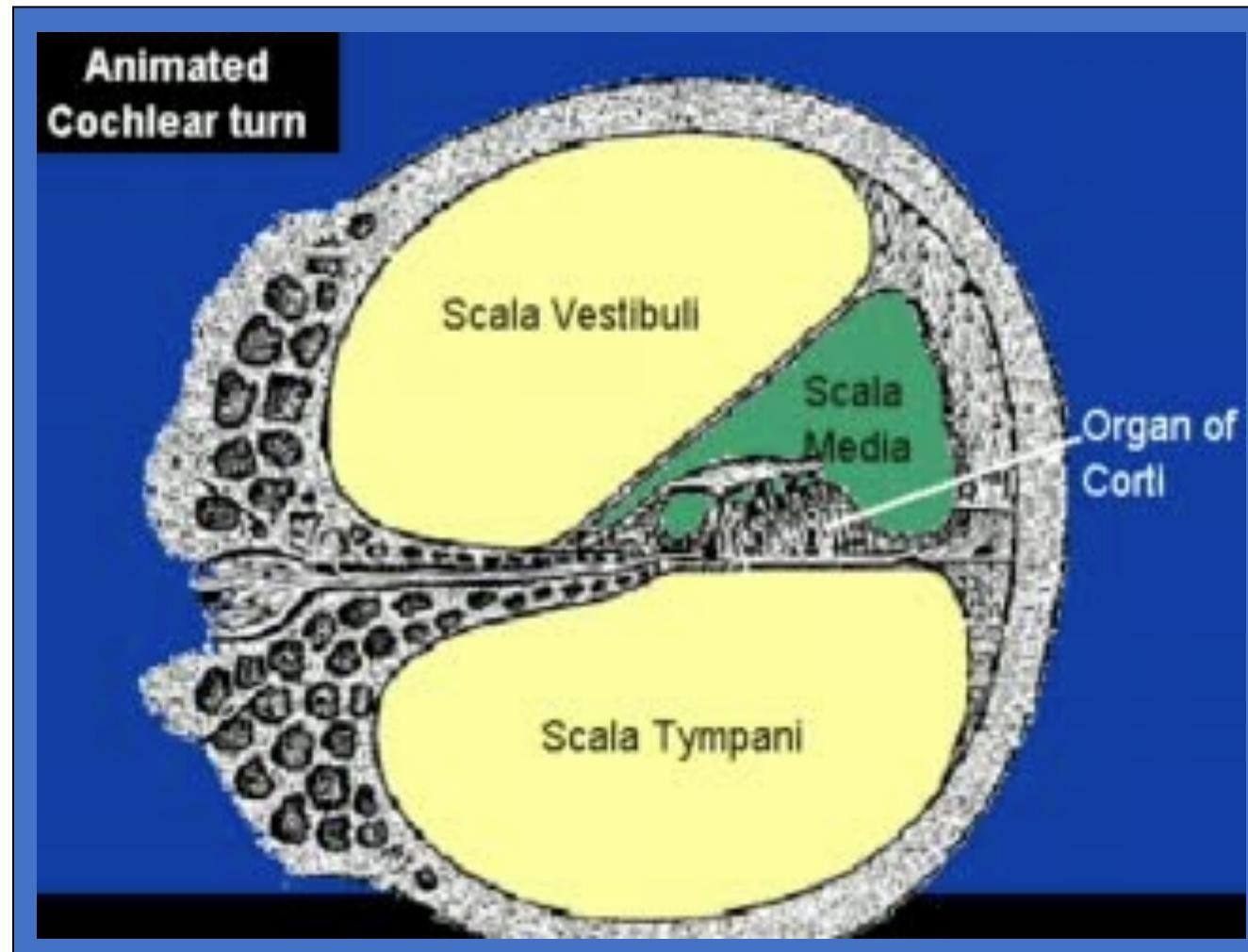
# Tonotopic map of the guinea pig cochlea



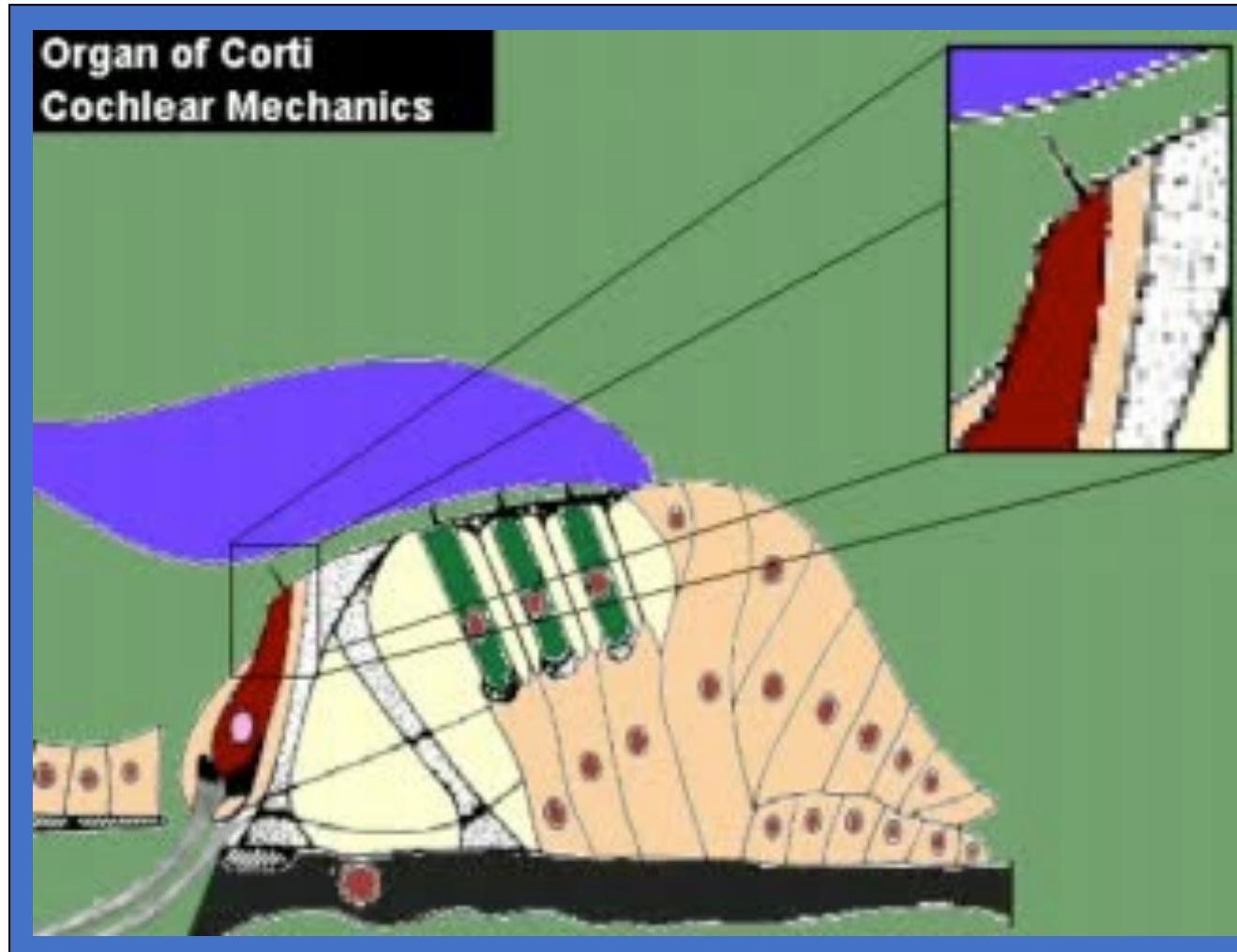
# Cochlea cross-section



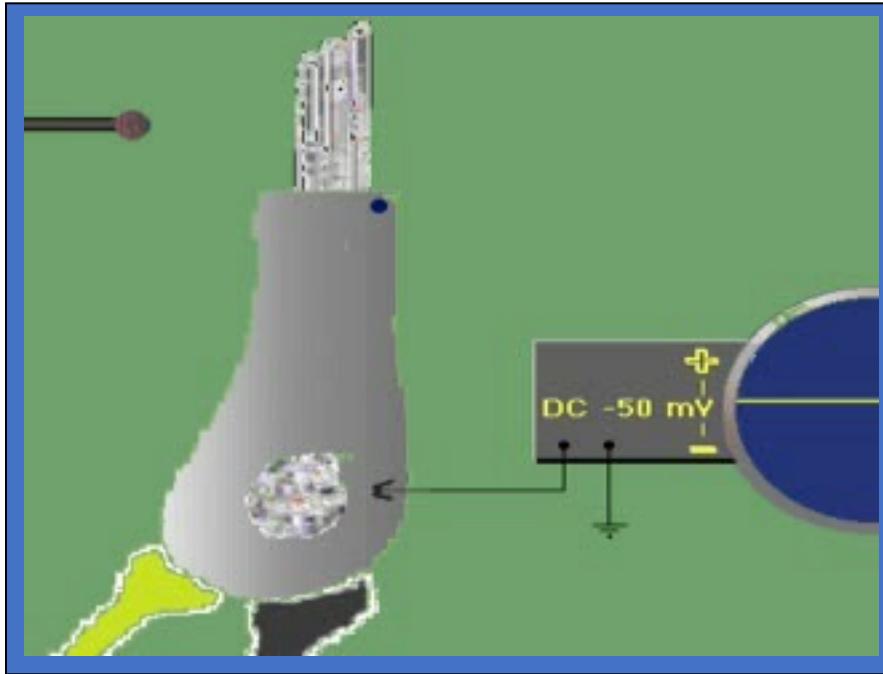
# The Organ of Corti



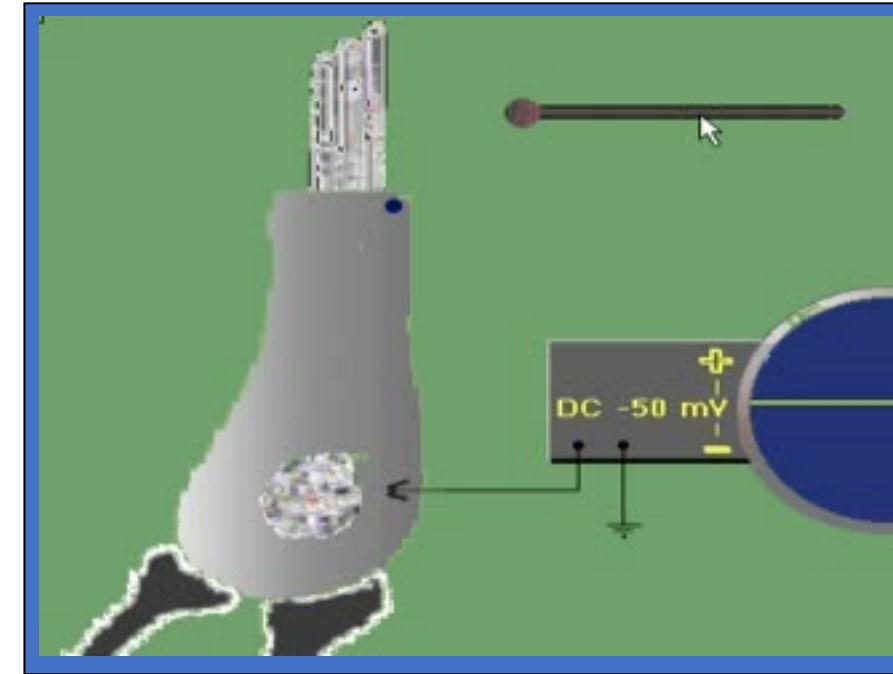
# Cochlear Mechanics in Organ of Corti



# The Inner Hair Cell



depolarization

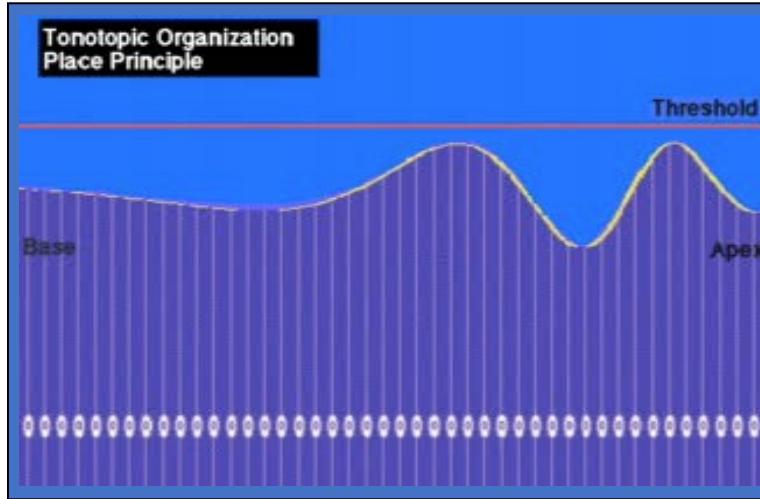


hyperpolarization

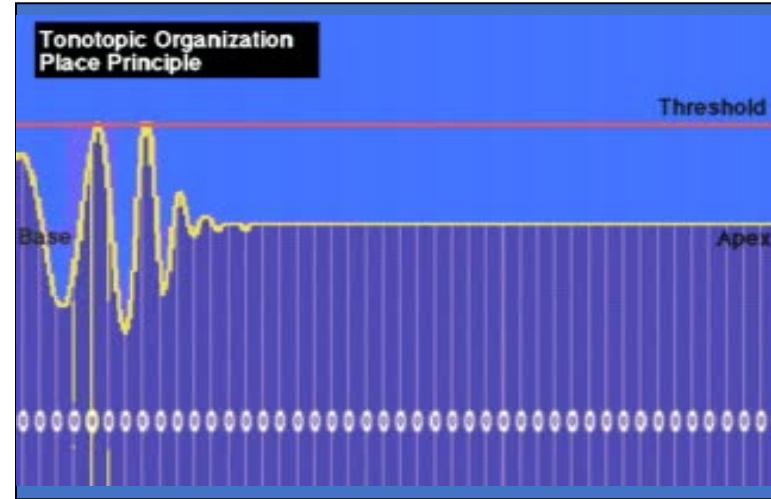
# Three Theories of Frequency Coding

- ✓ Place Coding Theory
- ✓ Phase locking Coding Theory
- ✓ Volley Theory

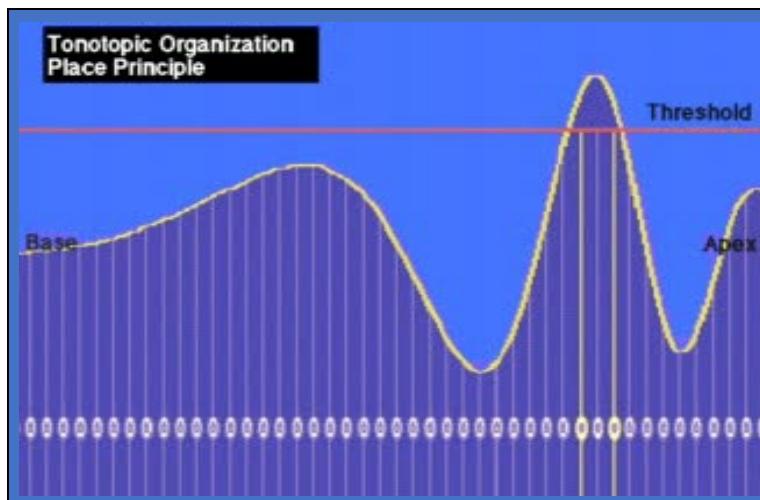
# Place Coding Theory



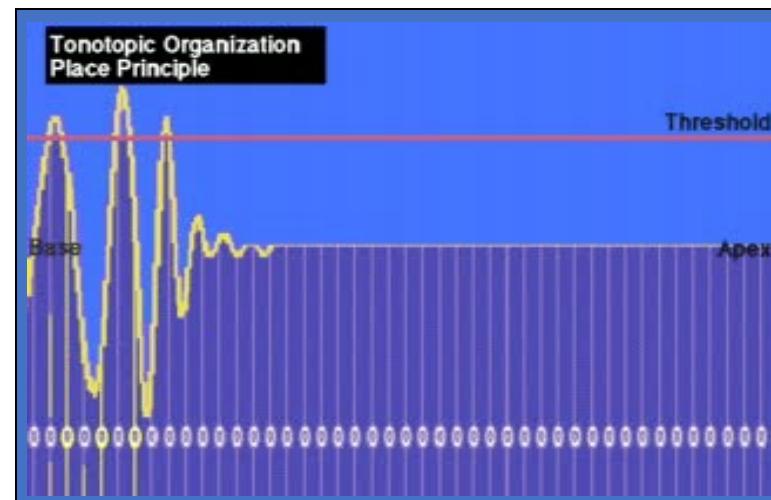
softer sound with 1kHz



softer sound with 8kHz

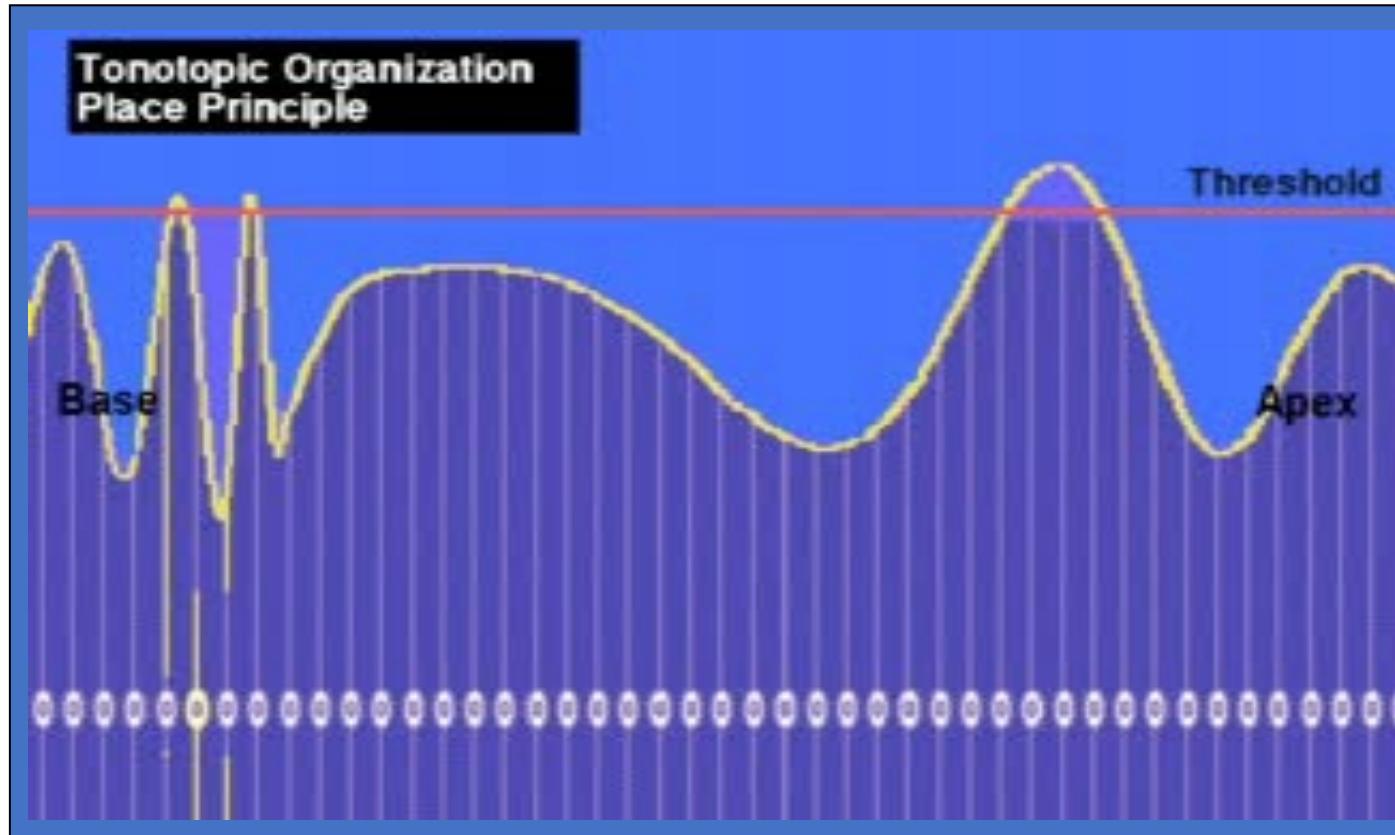


louder sound with 1kHz



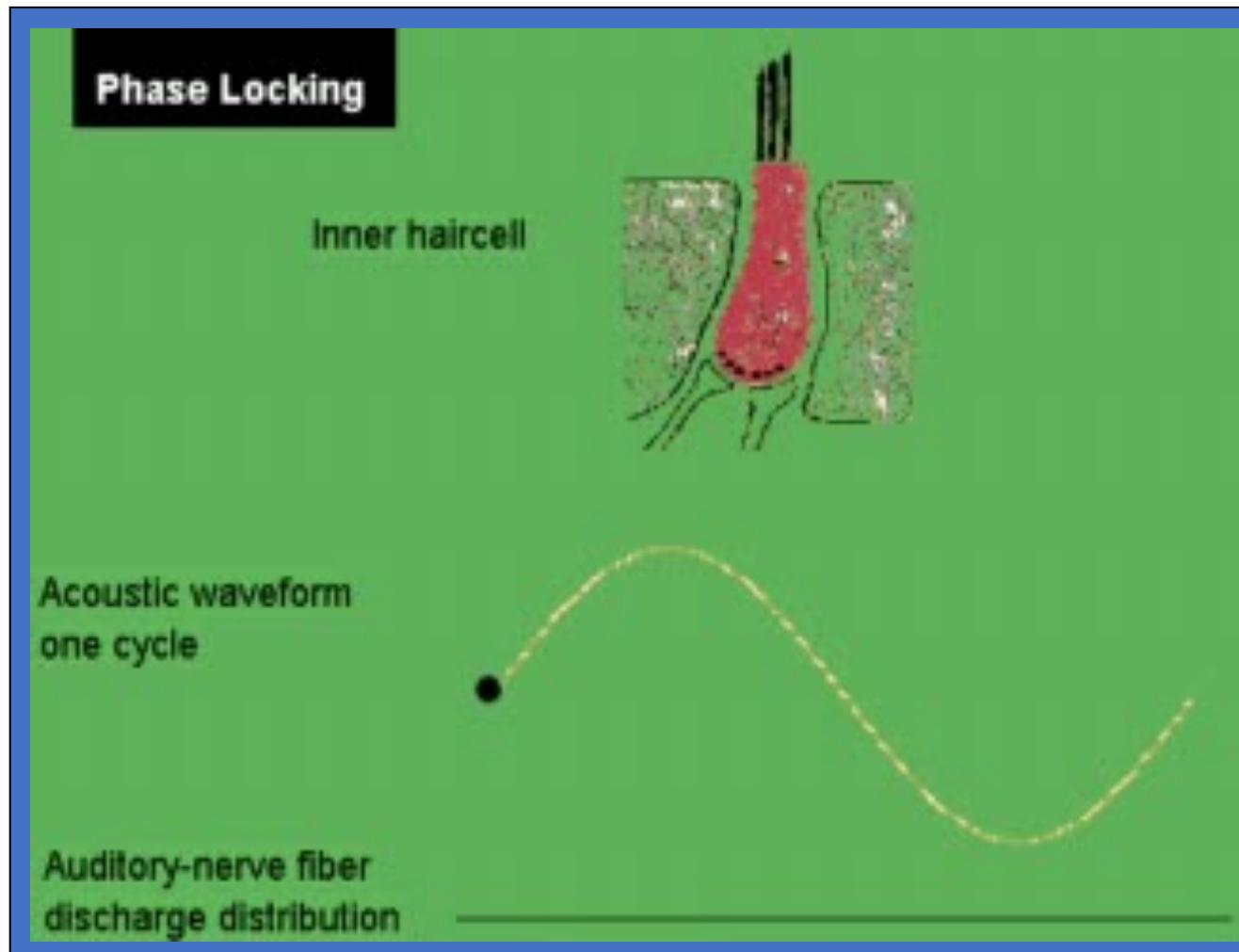
louder sound with 8kHz

# Place Coding Theory (cont.)

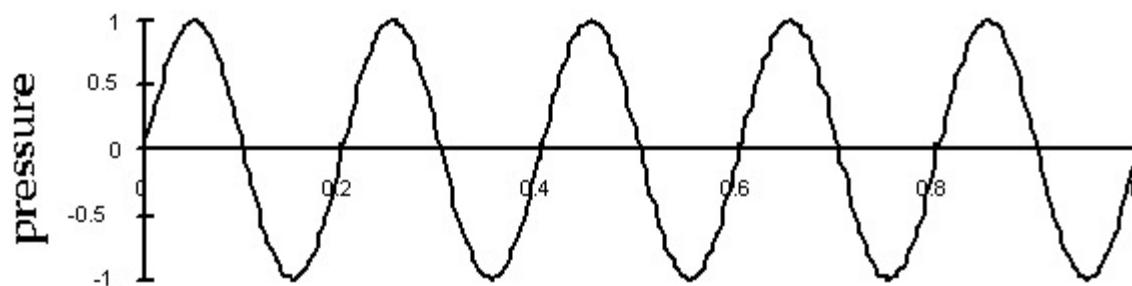


louder complex sound with 1kHz and 8kHz

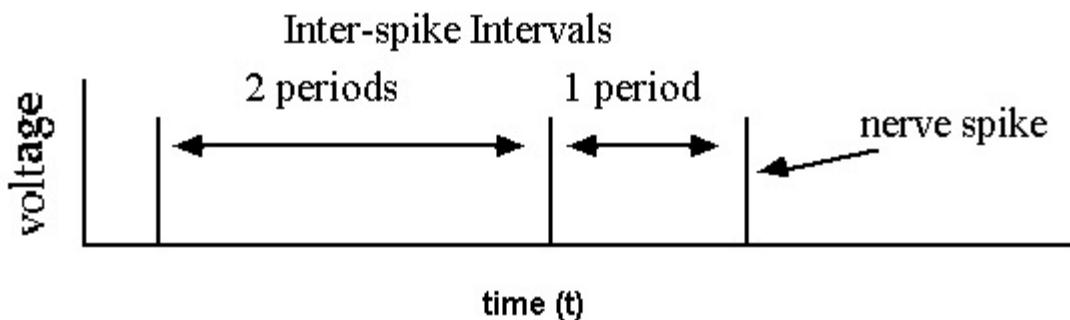
# Phase Locking Coding Theory



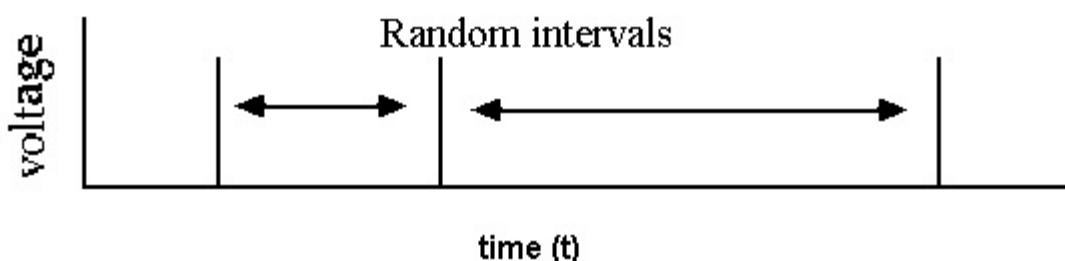
# Phase-locking



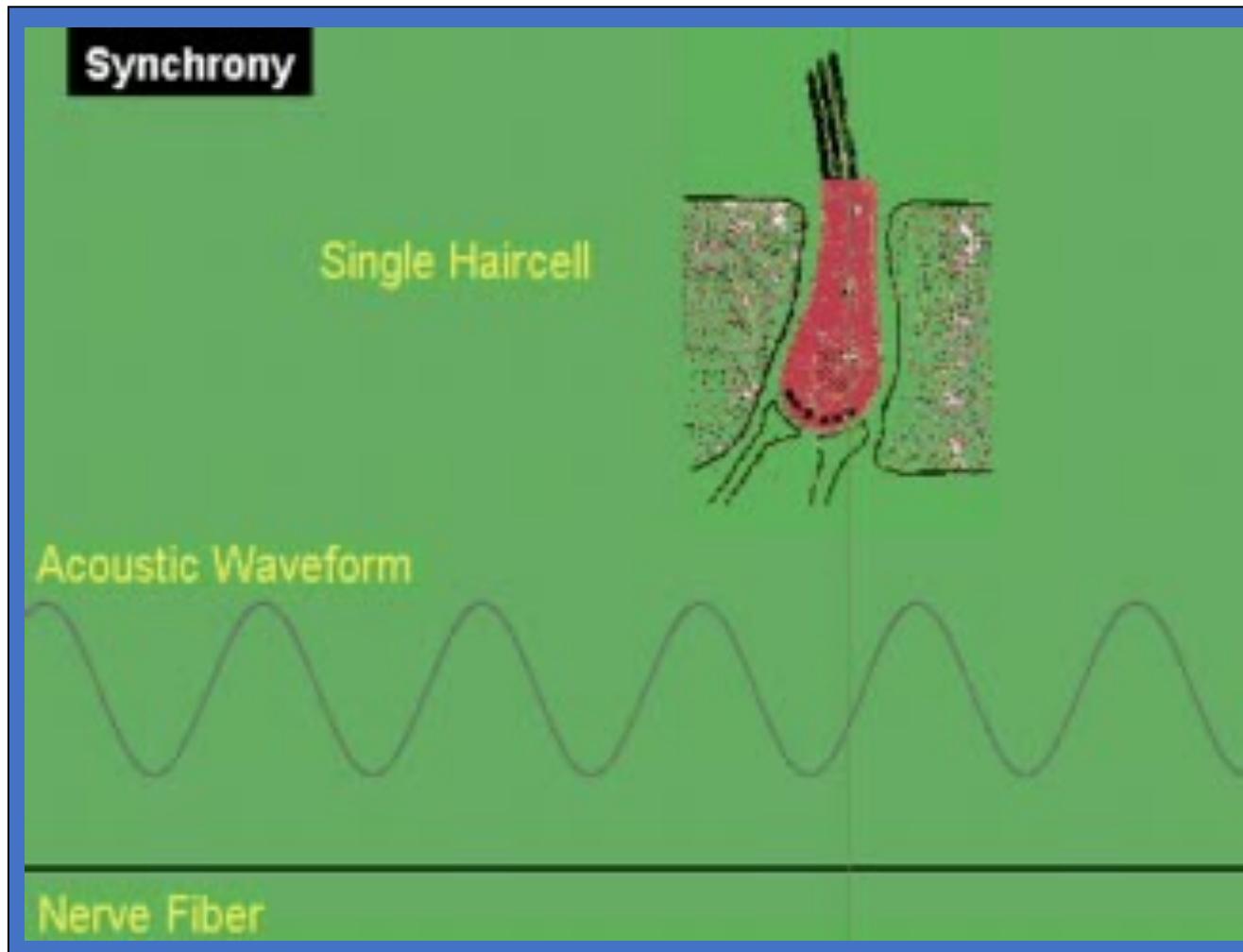
Response to Low Frequency tones



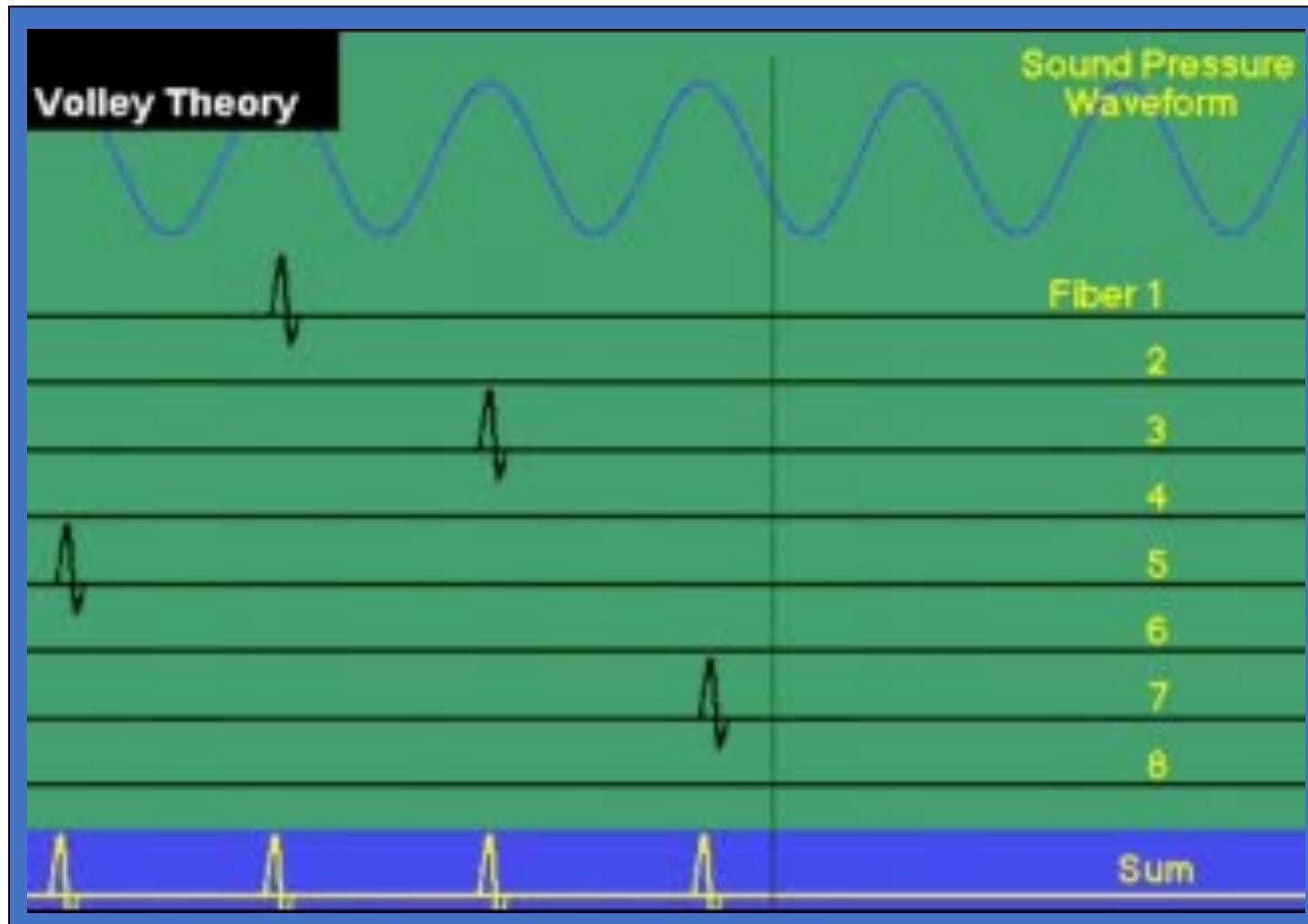
Response to High Frequency tones  $> 5\text{kHz}$



# Definition of Synchrony Firing



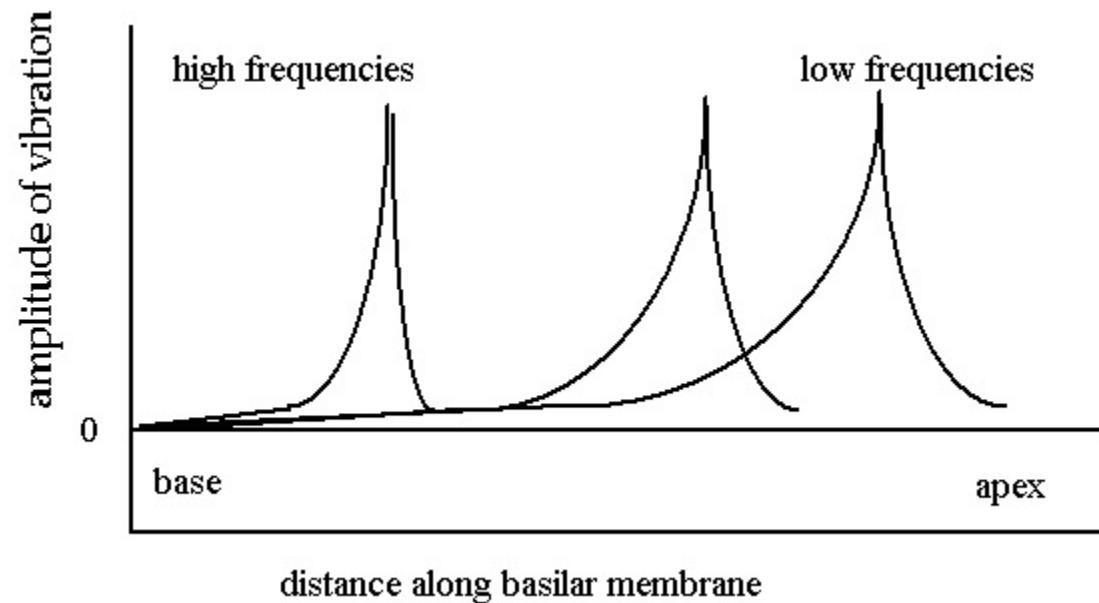
# Volley Theory



# Three Theories of Frequency Coding

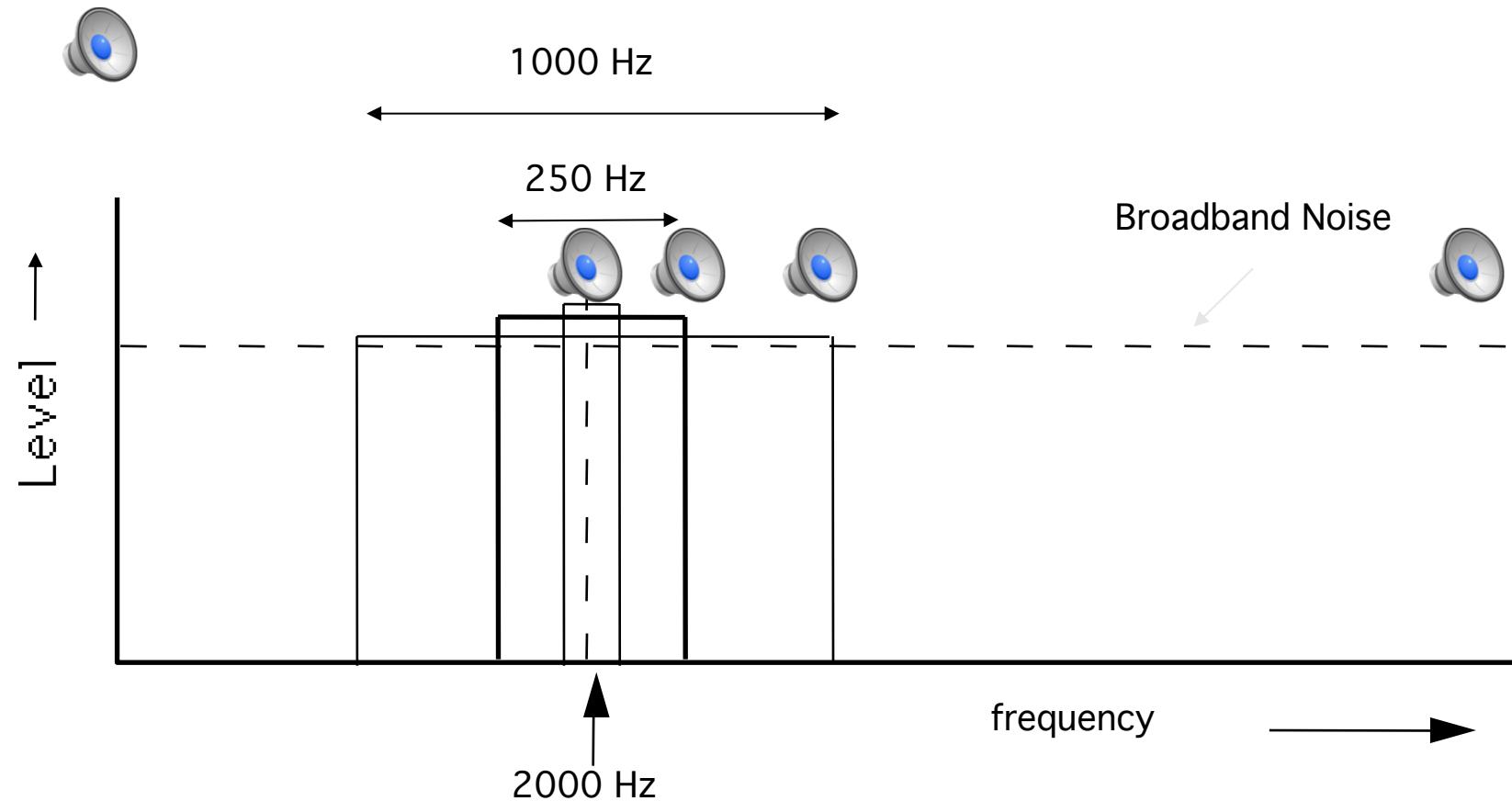
- ✓ Place Coding Theory
- ✓ Phase locking Coding Theory
- ✓ Volley Theory

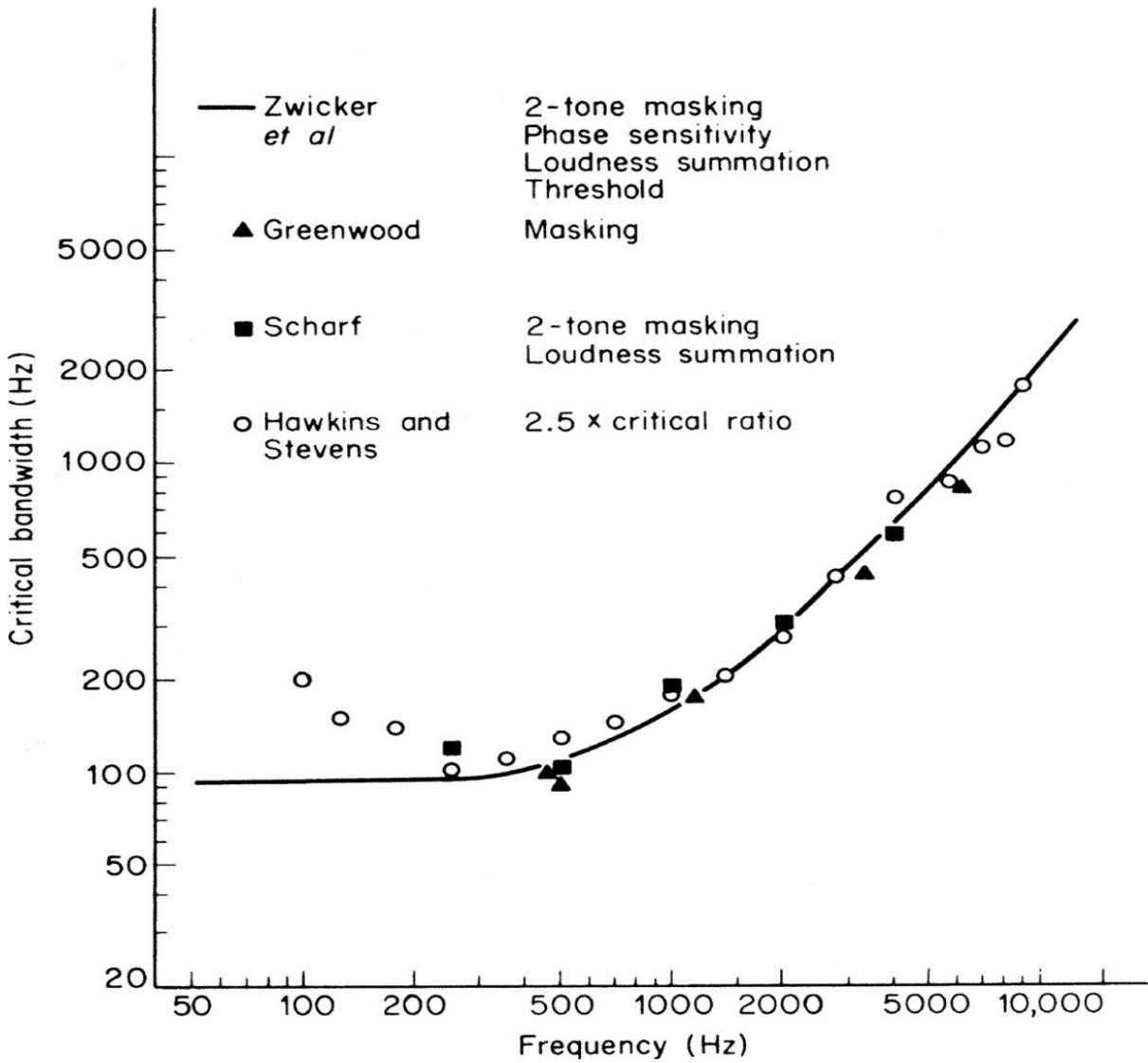
# Excitation patterns (envelope of excitation)



Basilar membrane excitation pattern is like a spectrum

# Measurement of auditory bandwidth with band-limited noise



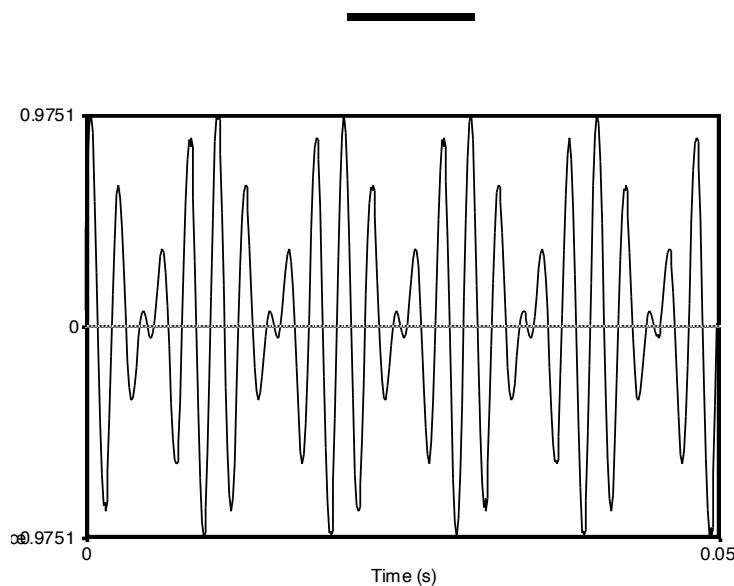


The width of critical bands as a function of center frequency

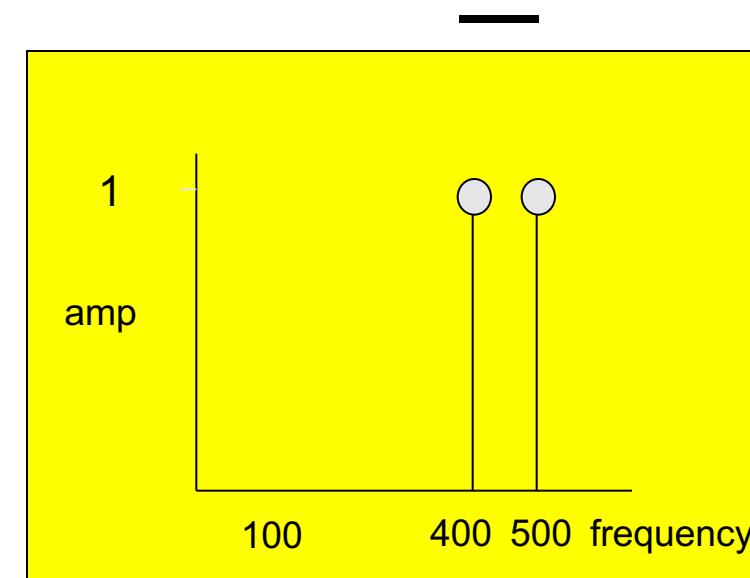
# Beats

Repetition rate is the difference in frequency between the two sine-wave components

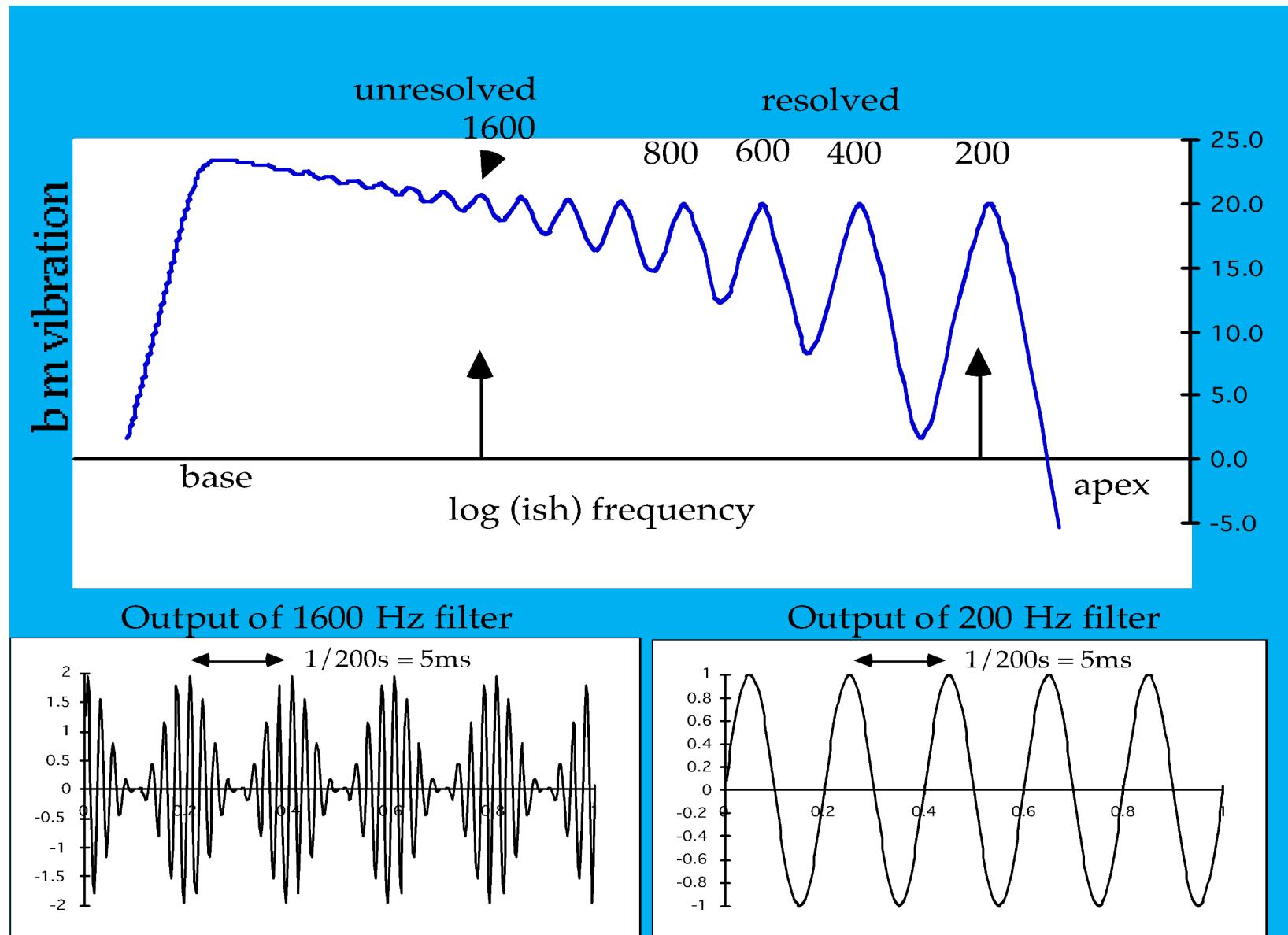
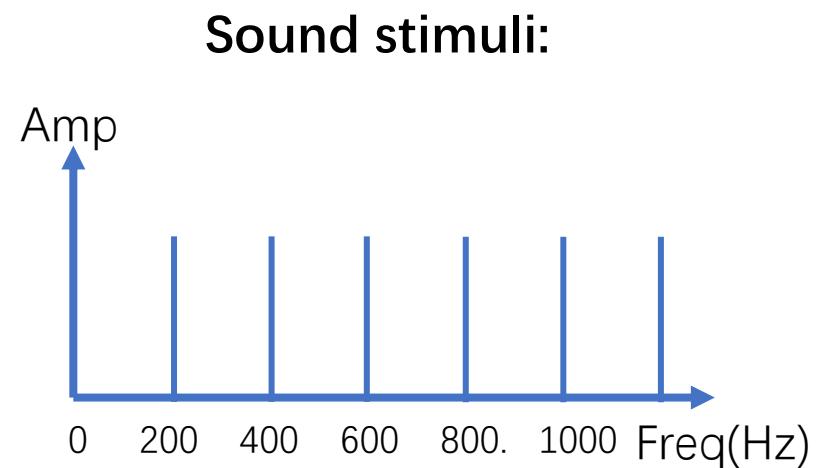
1/100th second



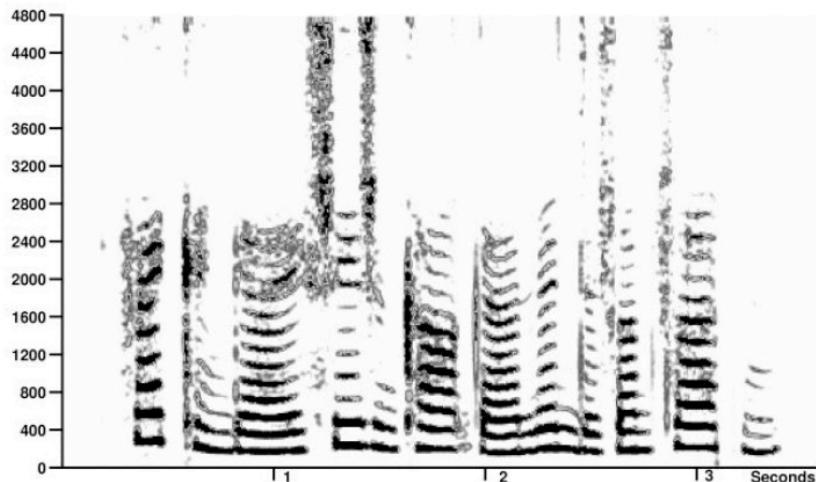
$500 - 400 = 100 \text{ Hz}$



# Excitation pattern of complex tone on BM

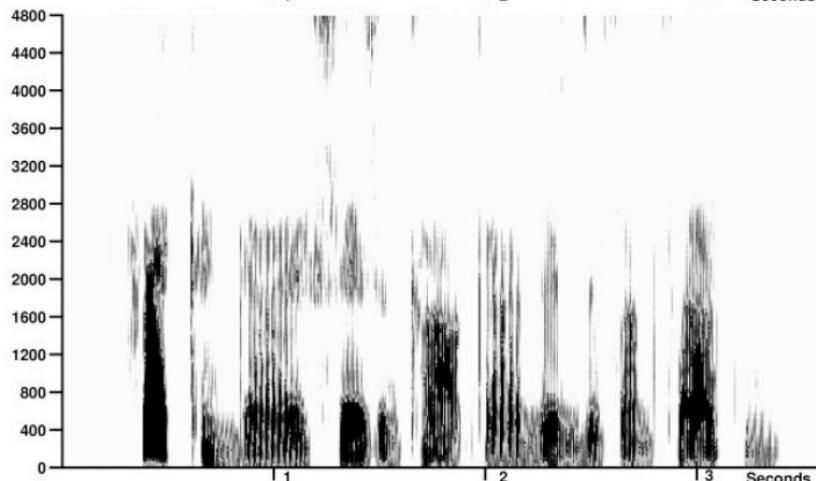


# What auditory structure should be represented?



Conventional spectrograms of speech:

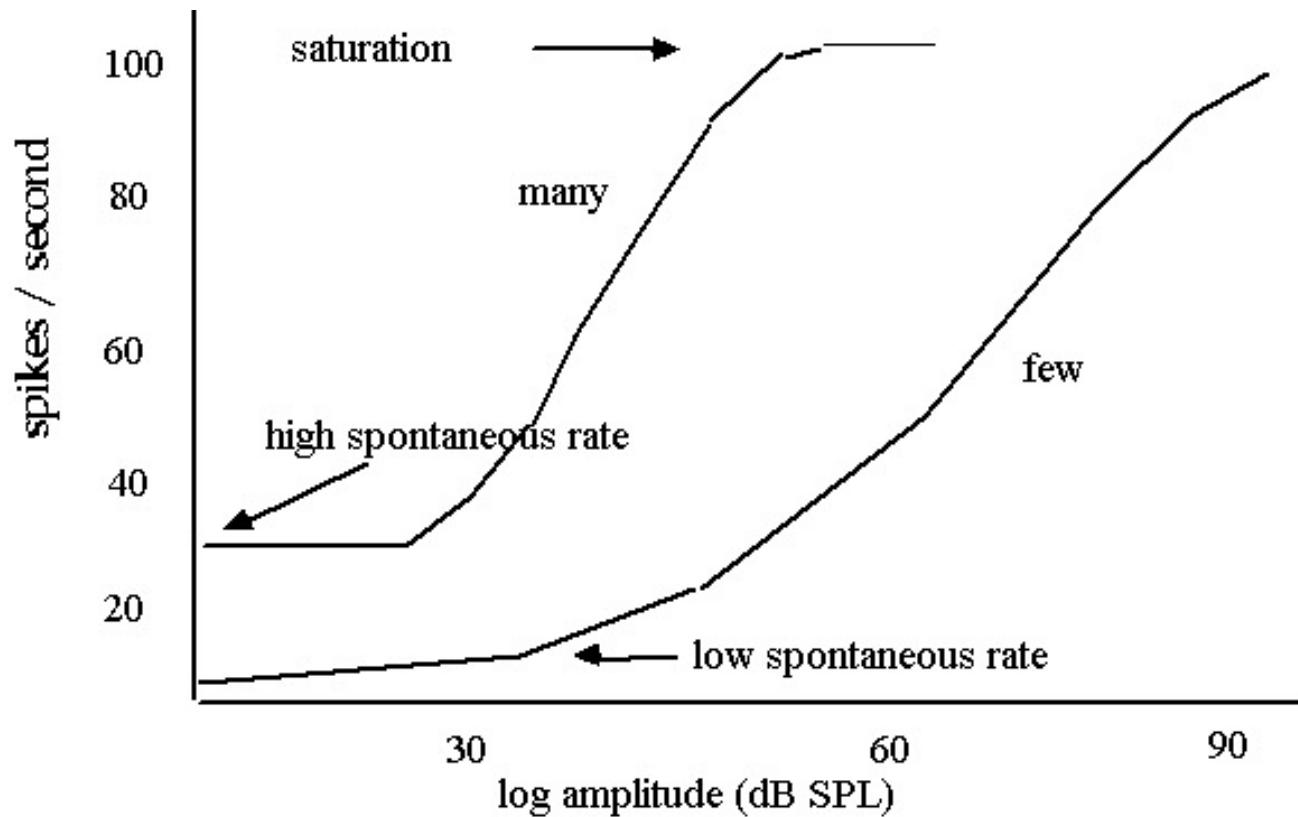
- upper time window: 20Hz
- lower time window: 200Hz



Auditory representation:

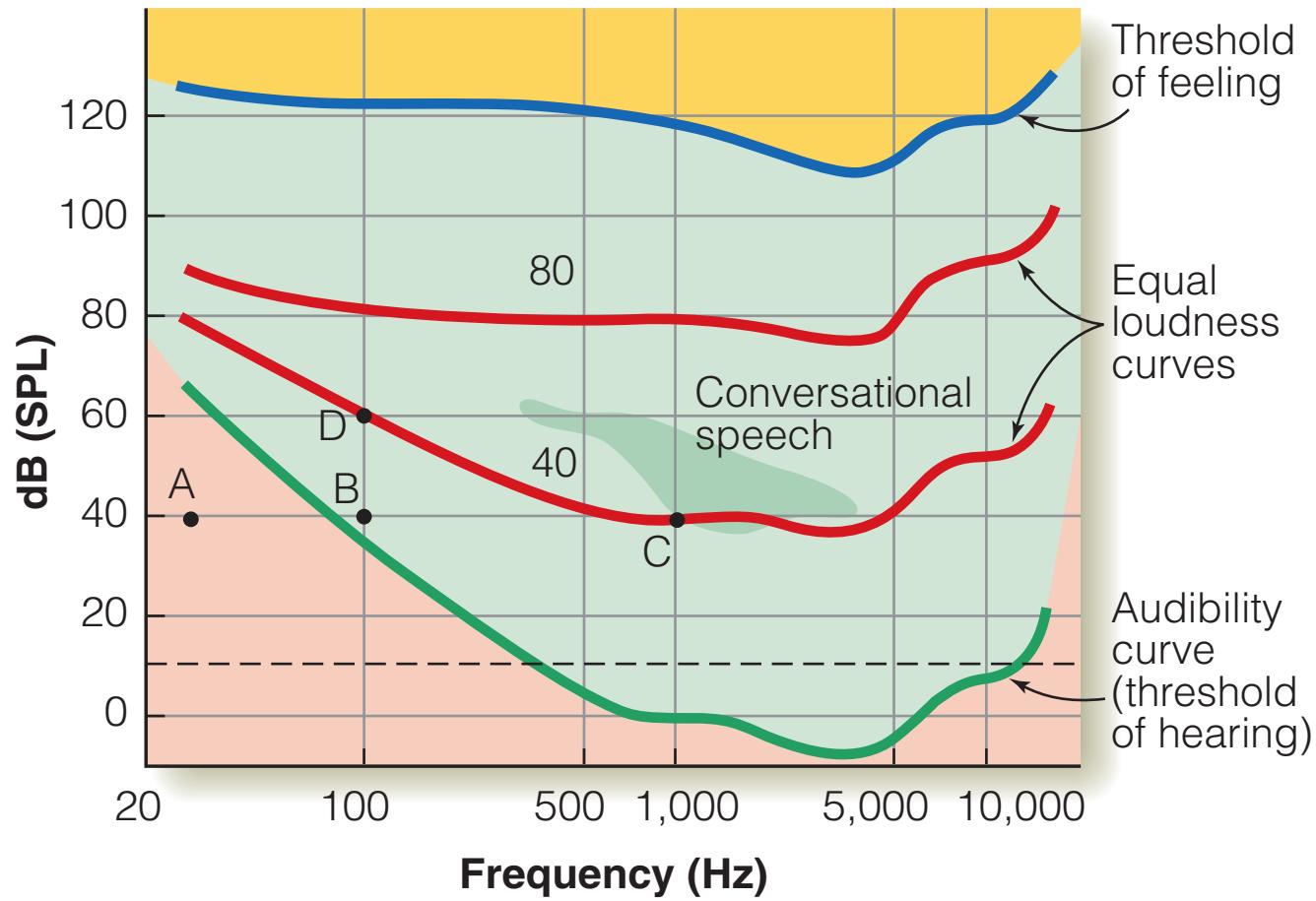
- low frequency: narrow bandpass filter
- high frequency: wide bandpass filter

# Intensity Coding



Auditory nerve rate-intensity functions

# The audibility curve and the auditory response area



# Inner vs Outer Hair Cells

Inner Hair Cells

---

Sensory

Afferent nerves

Single row

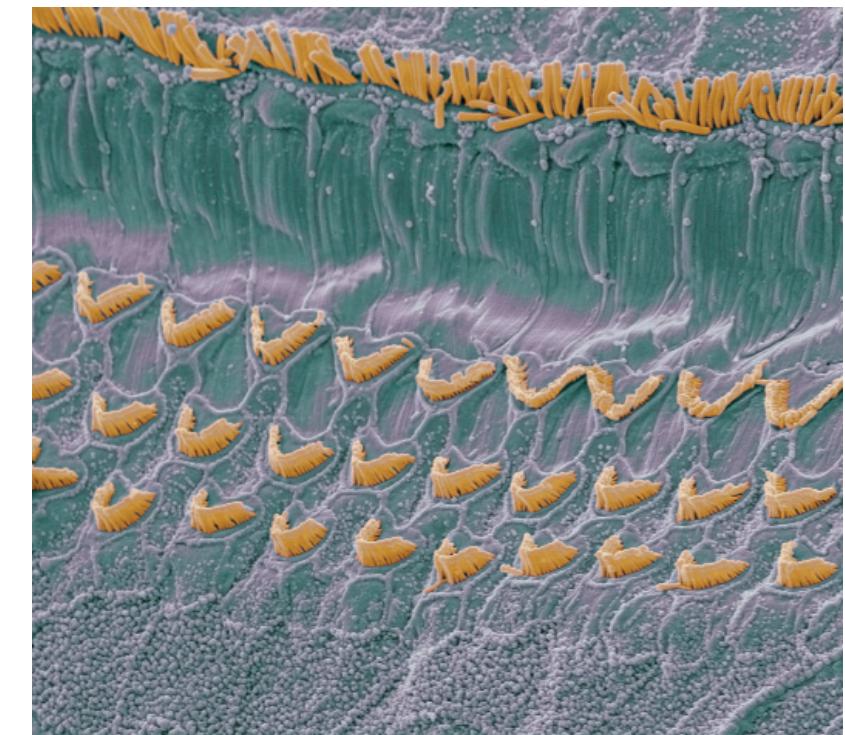
Outer Hair Cells

---

Motor

Efferent nerves

c.3 rows



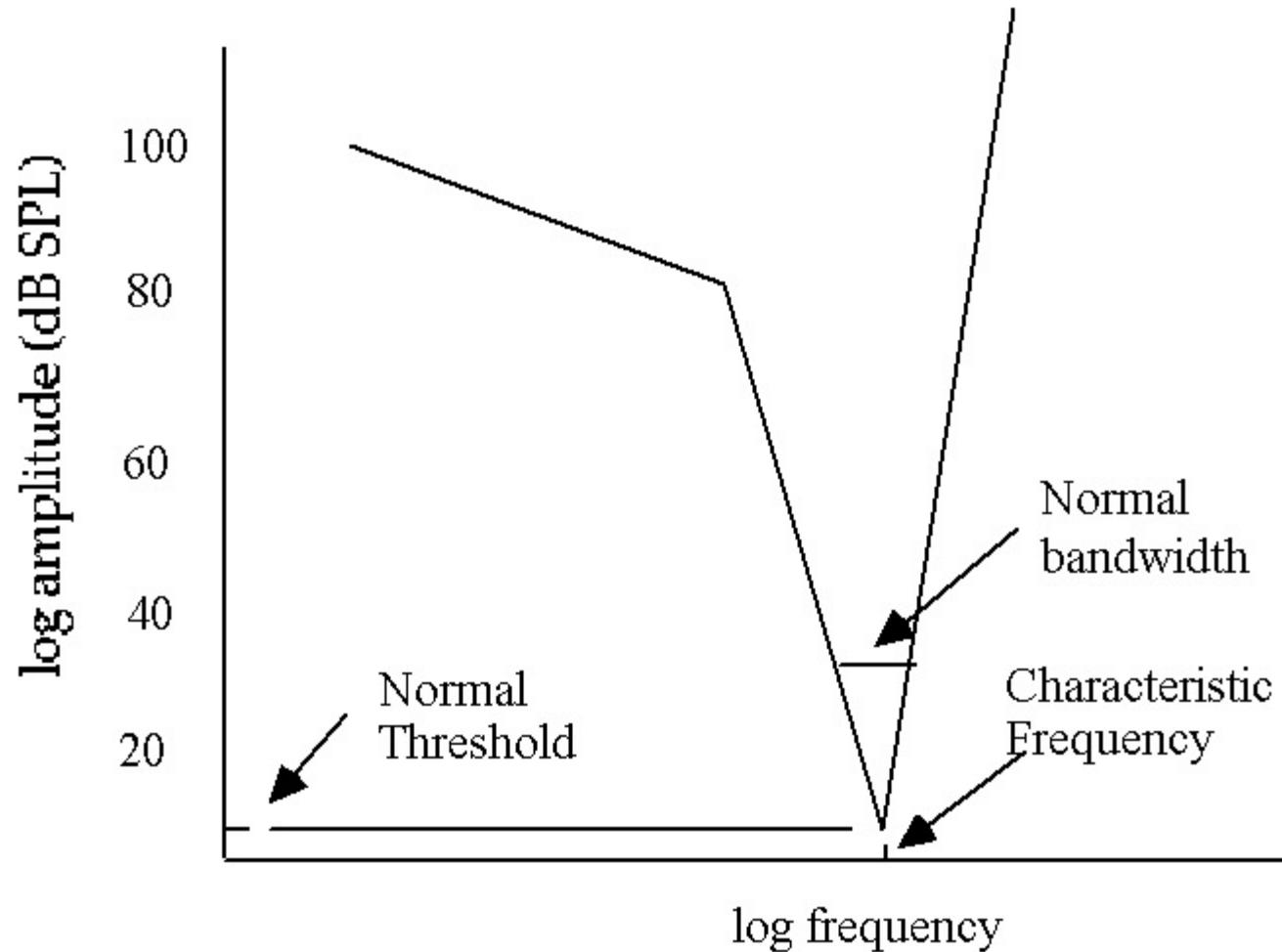
# OHC activity

OHCs are relatively more active for quiet sounds than for loud sounds.

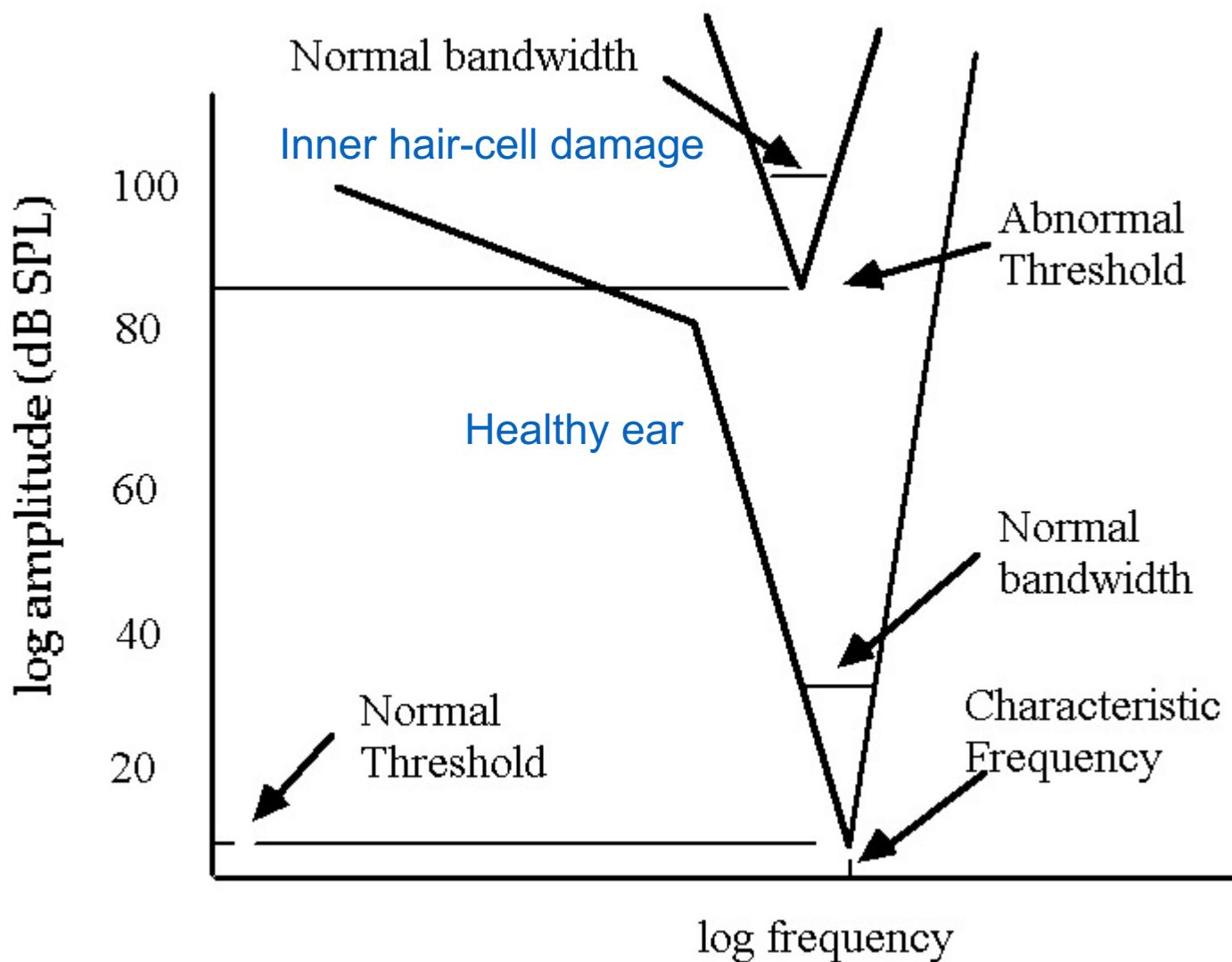
They only amplify sounds that have the characteristic frequency of their place.

- Increases sensitivity (lowers thresholds)
- Increases selectivity (reduces bandwidth of auditory filter)
- Gives ear a logarithmic (non-linear) amplitude response
- Produce Oto-acoustic emissions

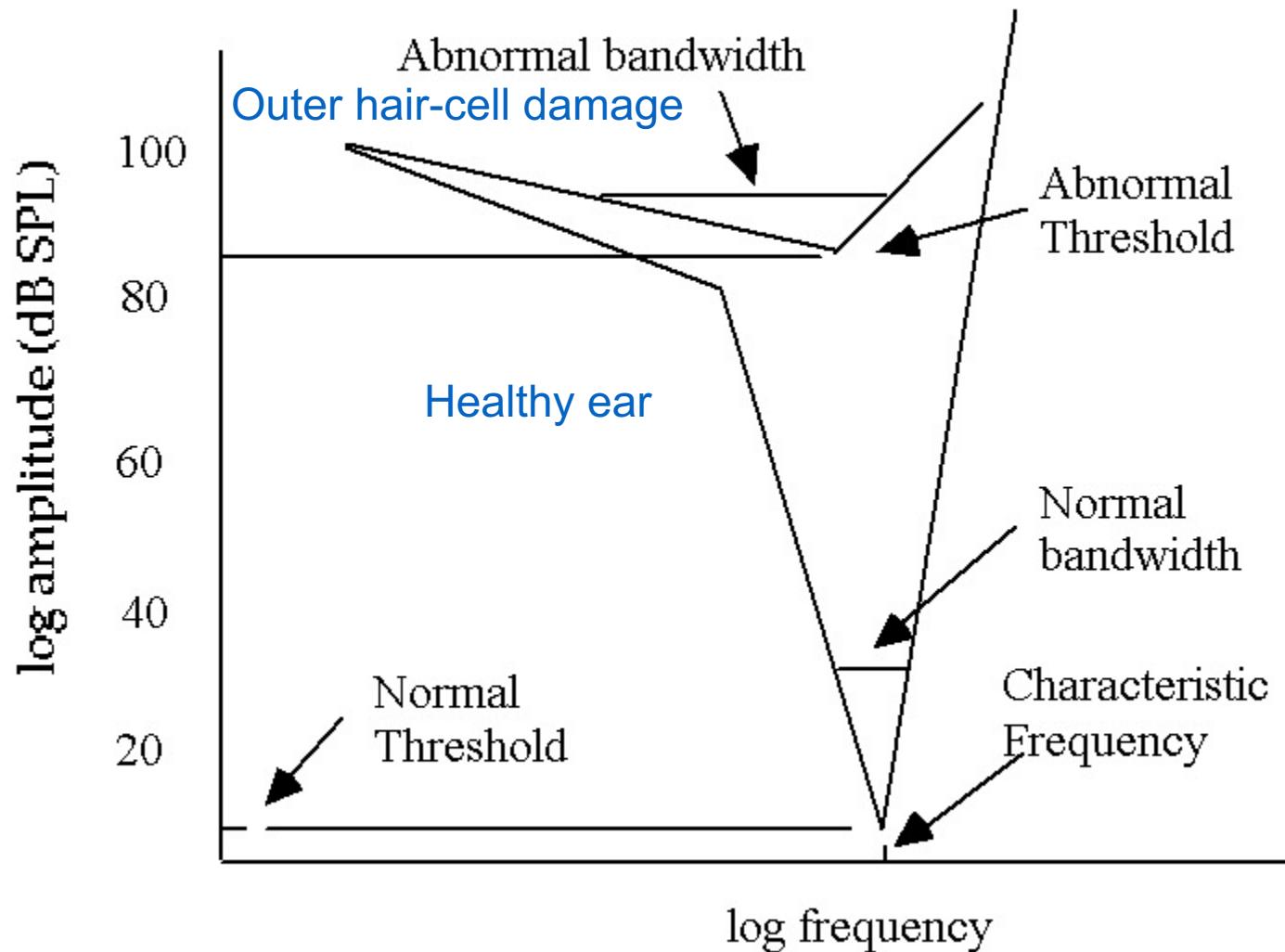
# Frequency-threshold curves



# Auditory tuning curves



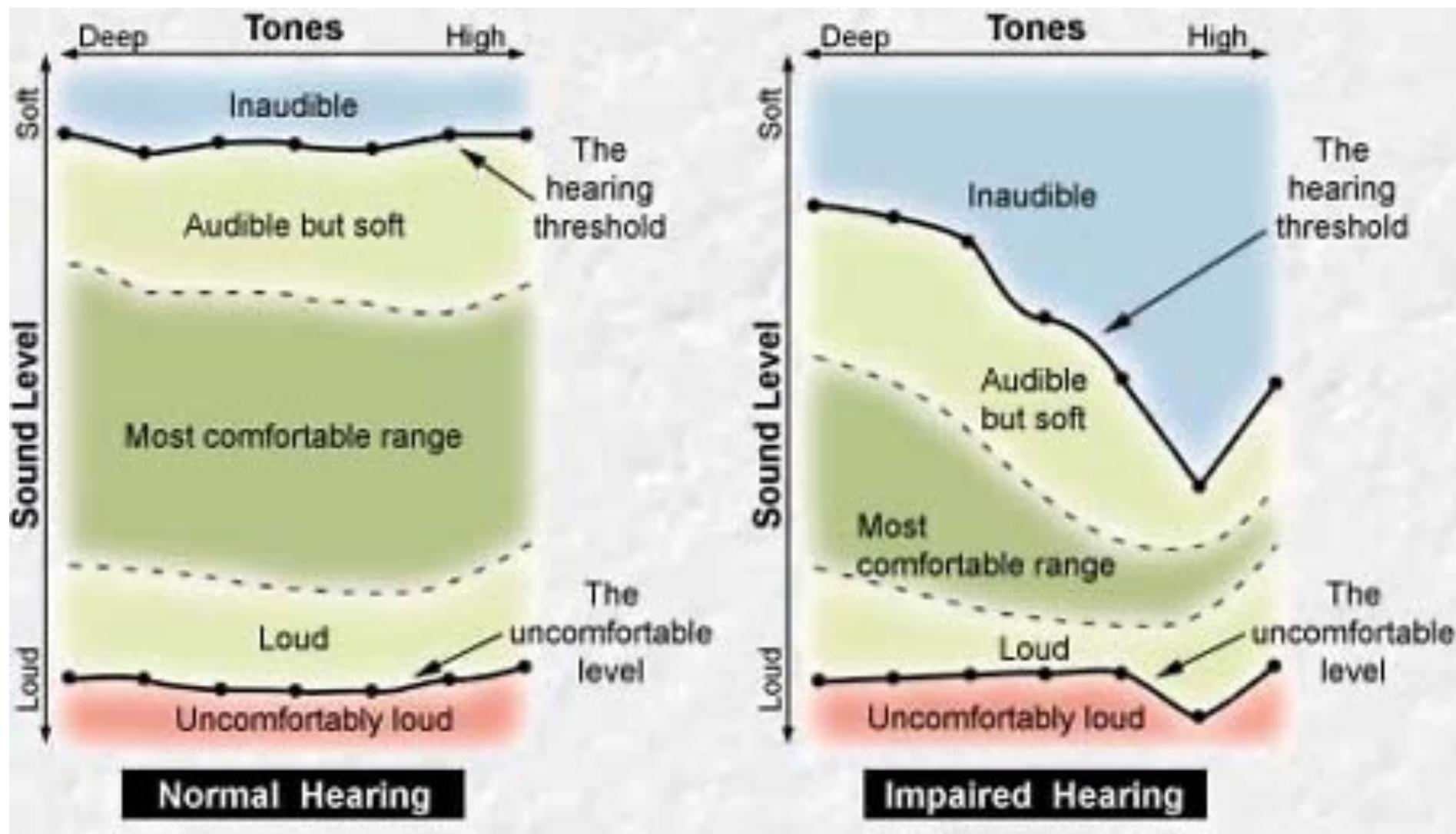
# Outer-hair cell damage



# Conductive vs. Sensori-neural deafness

	Conductive	Sensori-neural	Sensori-neural
Origin	Middle-ear	Cochlea (IHCs)	Cochlea (OHCs)
Thresholds	Raised	Raised	Raised
Filter bandwidths	Normal	Normal	<b>Increased</b>
Loudness growth	Normal	Normal	<b>Increased (Recruitment)</b>

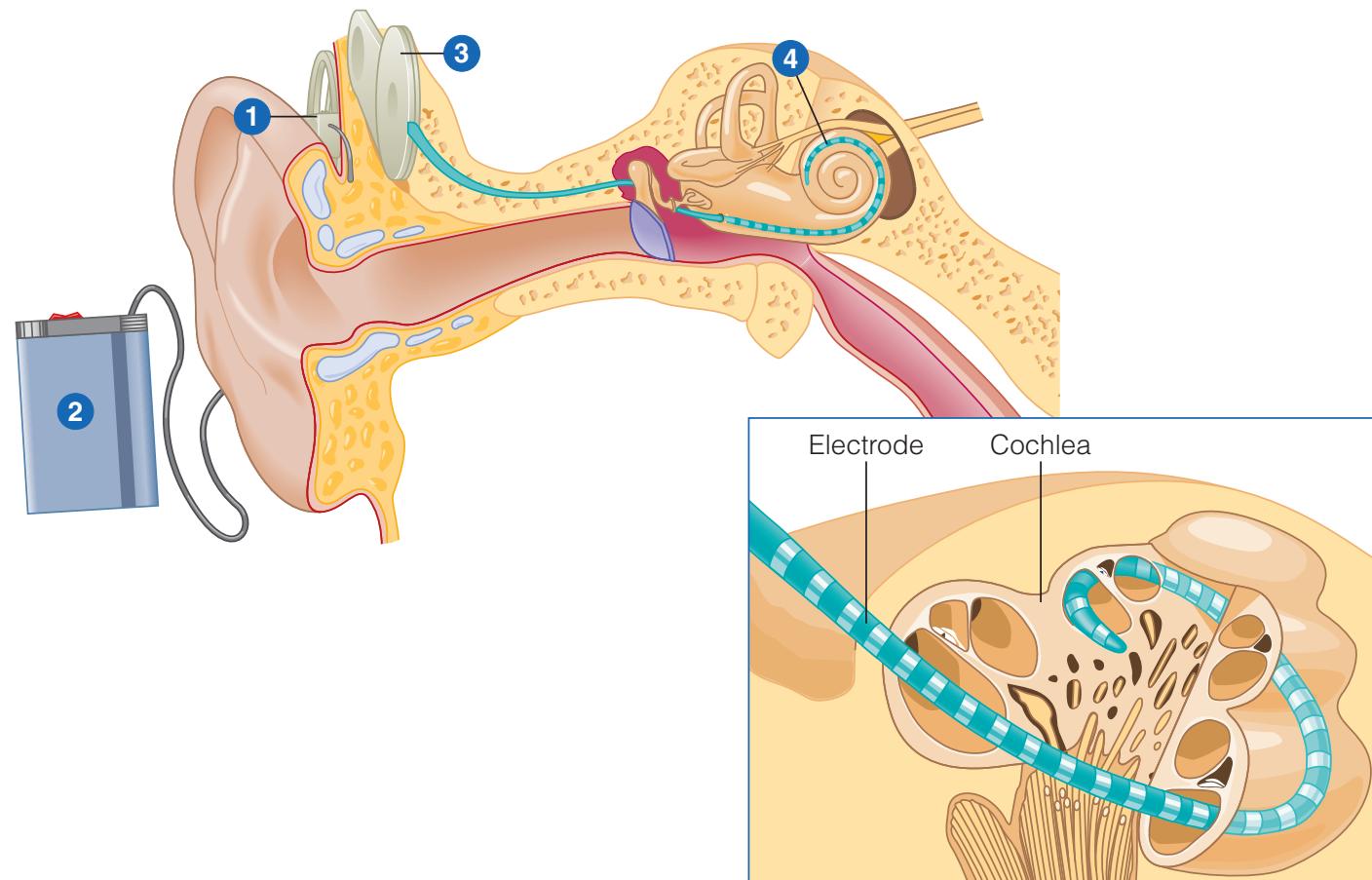
# Normal vs. Impaired Dynamic Range



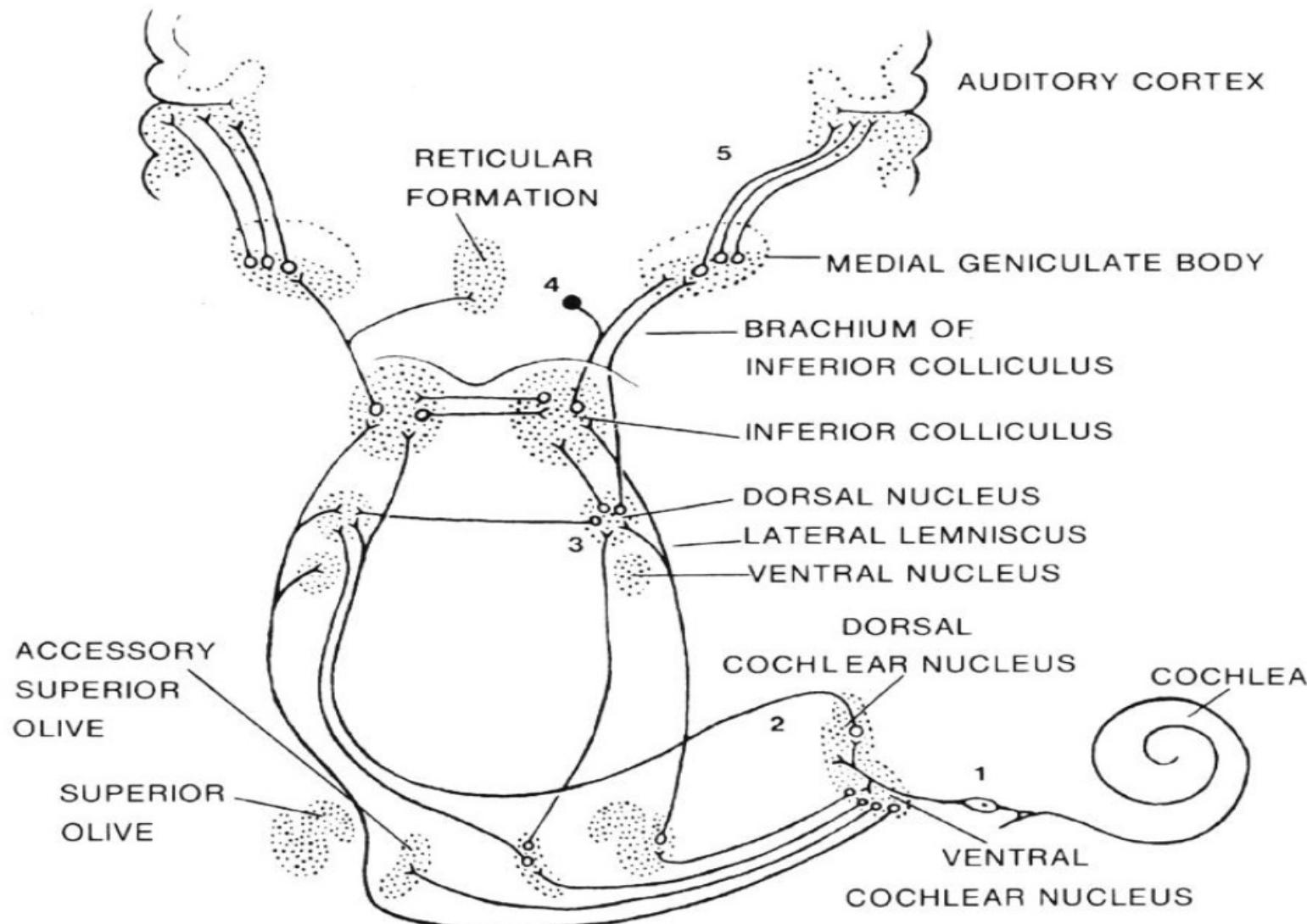
# Normal auditory non-linearities

- Normal loudness growth (follows Weber's Law, which is logarithmic, not linear)
- Combination tones
- Oto-acoustic emissions

# Hearing aid and Cochlear implant device



# Higher Levels in the Auditory System



Q&A