

# **L2: Speech production and perception**

**Anatomy of the speech organs**

**Models of speech production**

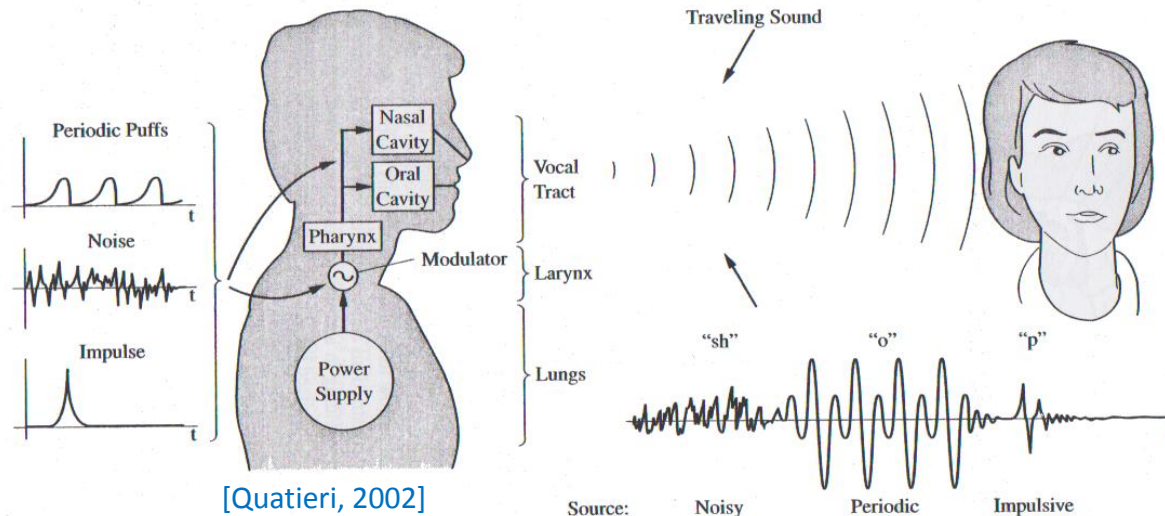
**Anatomy of the ear**

**Auditory psychophysics**

# Anatomy of the speech organs

## The speech organs can be broadly divided into three groups

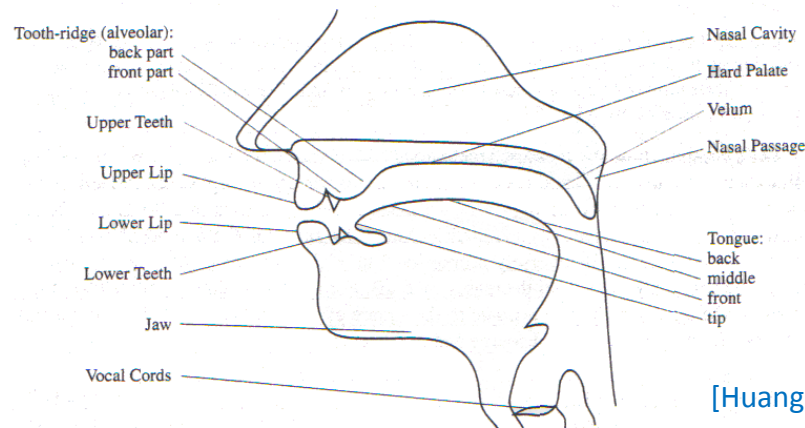
- Lungs: serve as a “power supply” and provides airflow to the larynx
- Vocal chords (Larynx): modulate the airflow into either a periodic sequence of puffs or a noisy airflow source
  - A third type of source is impulsive
  - Exercise, say the word “shop” and determine where each sound occurs
- Vocal tract: converts modulated airflow into spectrally “colored” signal



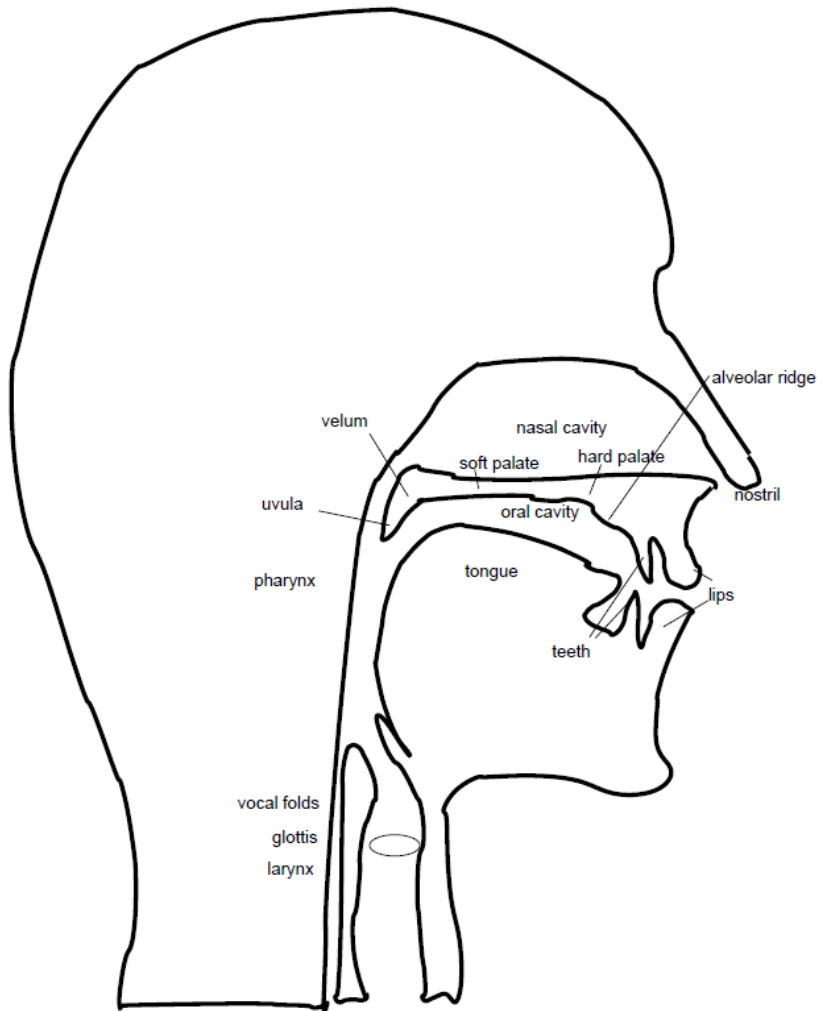
# The vocal tract

## The vocal tract can further be divided into

- Velum (soft palate): controls airflow through the nasal cavity. In its open position is used for “nasals” (i.e., [n], [m]).
- Hard palate: hard surface at the roof of the mouth. When tongue is pressed against it, leads to consonants
- Tongue: Away from the palate produces vowels; close to or pressing the palate leads to consonants
- Teeth: used to brace the tongue for certain consonants
- Lips: can be rounded or spread to shape consonant quality, or closed completely to produce certain consonants (i.e., [p], [b], [m])

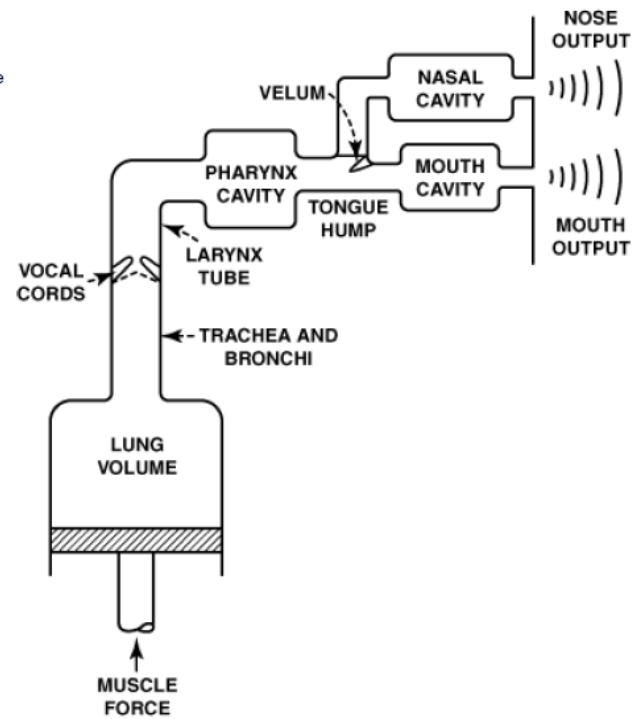


[Huang, Acero & Hon, 2001]



(a) mid-sagittal drawing of vocal organs

[Taylor, 2009]

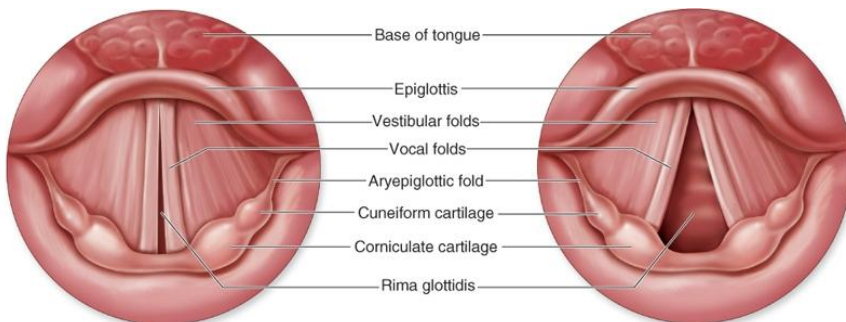


(b) Model of vocal organs with discrete components identified

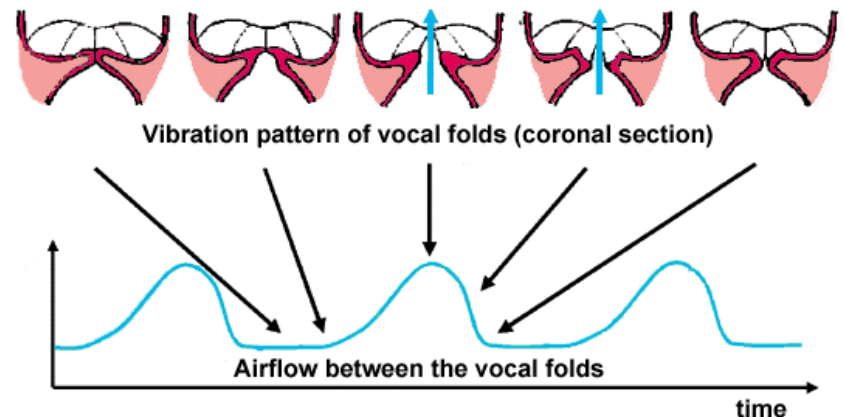
# The vocal folds

## Two masses of flesh, ligament and muscle across the larynx

- Fixed at the front of the larynx but free to move at the back and sides
- Can be in one of three primary states
  - Breathing: Glottis is wide, muscles are relaxed, and air flows with minimal obstruction
  - Voicing: vocal folds are tense and are brought up together. Pressure builds up behind, leading to an oscillatory opening of the folds ([video](#))
  - Unvoiced: similar to breathing state, but folds are closer, which leads to turbulences (i.e. aspiration, as in the sound [h] in 'he') or whispering



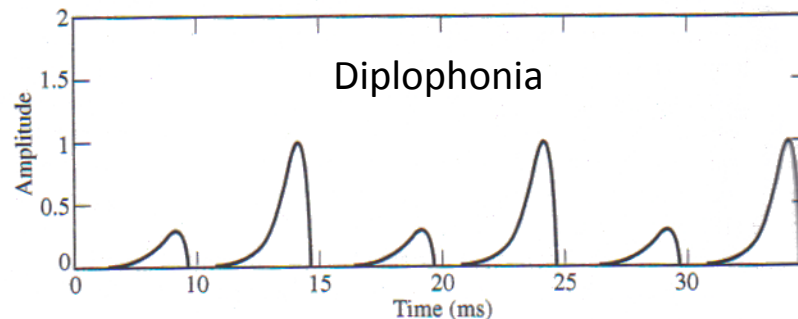
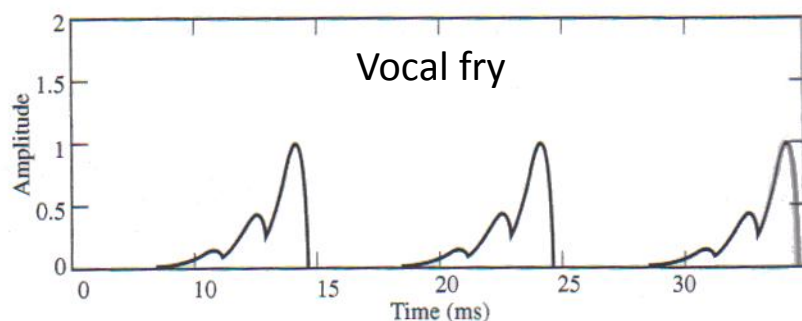
[http://academic.kellogg.edu/herbrandsonc/bio201\\_mckinley/f25-5b\\_vocal\\_folds\\_lary\\_c.jpg](http://academic.kellogg.edu/herbrandsonc/bio201_mckinley/f25-5b_vocal_folds_lary_c.jpg)



<http://biorobotics.harvard.edu/research/heather2.gif>

## Other (minor) forms of voicing include

- Hoarse voice: voicing period (pitch) jitters, as what results from laryngitis or a cold
- Breathy voice: aspiration occurs simultaneously while voicing ([audio](#))
- Creaky voice: vocal folds are very tense and only a portion oscillates. Result is a harsh sounding voice ([audio](#))
- Vocal fry: folds are very relaxed, which leads to secondary glottal pulses ([video](#))
- Diplophonic: secondary pulses occur, but during the closed phase



[Quatieri, 2002]

# Models of speech production

## Acoustic theory of speech production

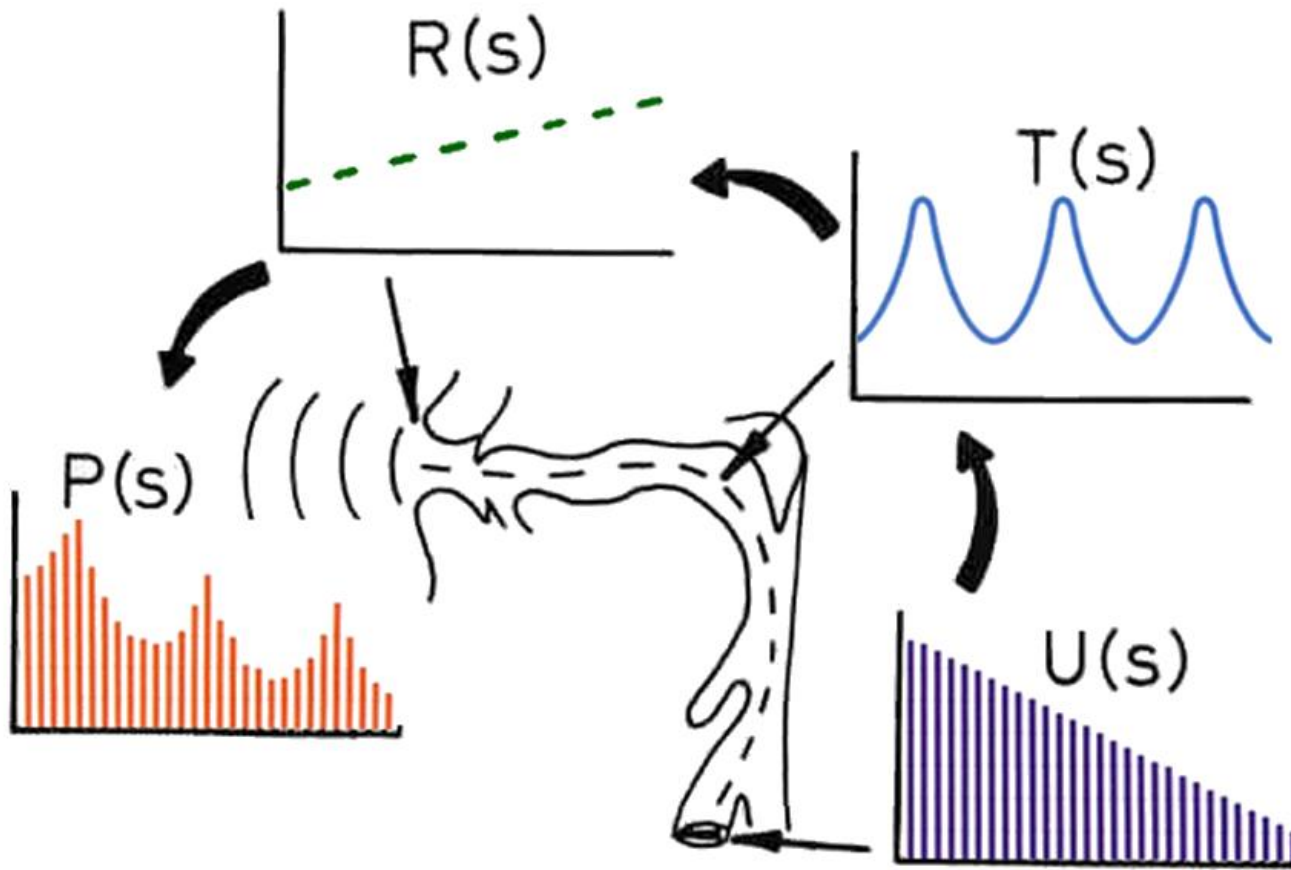
- Speech occurs when a source signal passing through the glottis is modified by the vocal tract acting as a filter
- Models of this kind are generally known as *source-filter* models
- Using the theory of linear time invariant (LTI) systems, the overall process can be modeled in the z-domain (see lecture 4) as

$$Y(z) = U(z)P(z)O(z)R(z)$$

- where  $U(z)$  is the glottal source, and  $P(z)$ ,  $O(z)$ ,  $R(z)$  are the transfer functions at the pharynx, oral cavity and lips
- which can be simplified as

$$Y(z) = U(z)V(z)R(z)$$

- by combining  $P(z)$  and  $O(z)$  into a single vocal-tract transfer function, which represents the filter component of the model



$$P(s) = U(s) T(s) R(s)$$

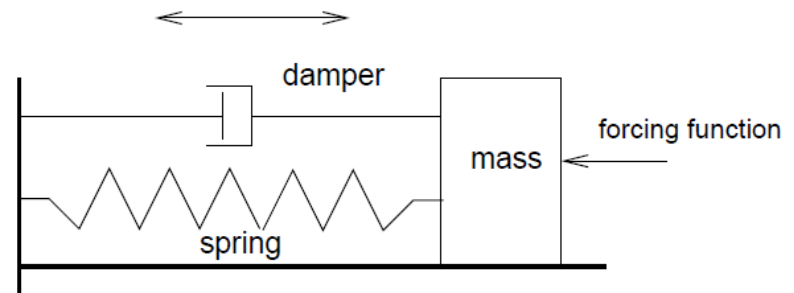


# The physics of sounds

## Resonant systems

- Consider the mass spring shown below
  - If you displace the mass, the system will try to return to its rest position
  - In the process, it will lead to oscillations around the rest position
  - Due to frictions, the mass will eventually settle onto the rest position
- Now consider a periodic forcing function being applied
  - At a certain frequency  $f_R$ , the size of the oscillations will increase over time rather than decrease
  - Eventually, and in the absence of other factors, the system will break
  - Frequency  $f_R$  is known as the resonant frequency of the system

$$f_R = \frac{1}{2\pi} \sqrt{\frac{k}{m}}$$



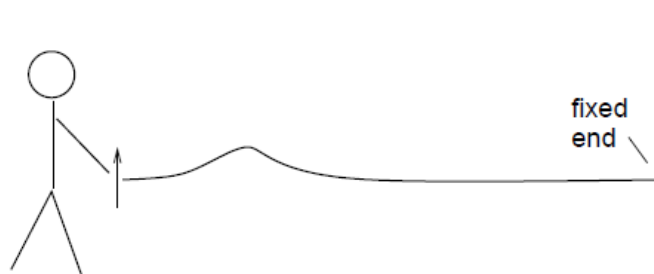
[Taylor, 2009]

# The Tacoma Narrows Bridge

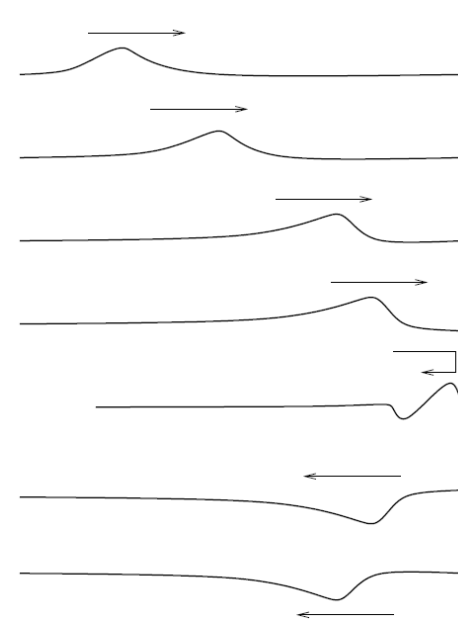


## Travelling and standing waves

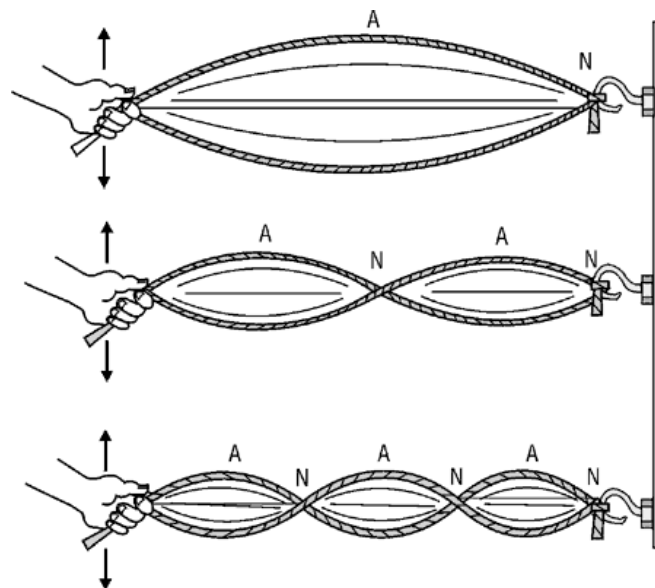
- Consider a person holding a rope fixed to a wall on the opposite end
  - The person gives a jerk to the rope, and as a result a wave forms and starts travelling down the rope
  - When the rope reaches the wall, it is reflected and begins to travel back towards the person
  - When it reaches the person, the wave is reflected back towards the wall
  - This process goes on until all energy in the rope dissipates



[Taylor, 2009]



- Now consider the person performs a repetitive movement
  - The forward and backward wave will interfere, which may lead to full cancellation (if the two waves are in anti-phase)
  - At some frequencies, the reflected wave will reinforce the forward wave, and the rope settles into a fixed pattern
  - The resulting wave will appear not to be moving at all (a standing wave)
  - Thus the rope acts as a resonator: it amplifies some waves and attenuates others

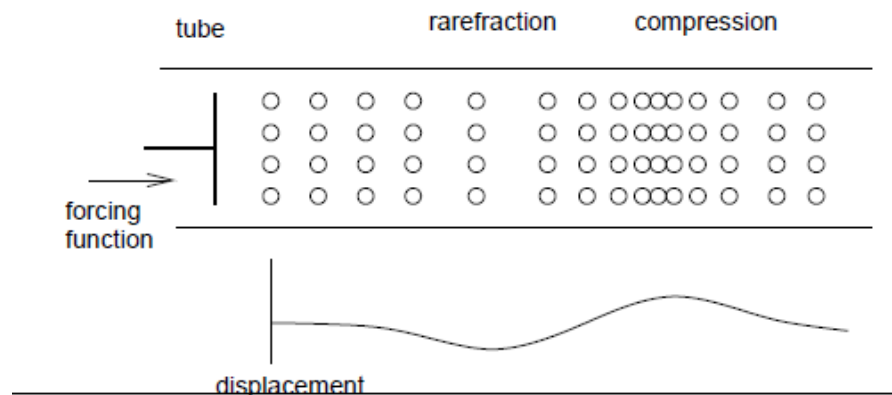


<http://www.cccc.edu/instruction/slympany/ELN/236/Mod7/loet01-07-06new.gif>

- What determines the behavior of the system?
  - The frequency of the oscillations is determined entirely by the hand
  - The rate of travel of the wave is determined entirely by the rope
  - Boundary conditions: whether the rope is fixed or free at each end.
- What is the relationship with the speech signal?
  - The hand acts as the source (the glottal pulses)
  - The rope acts as the filter (the vocal tract)

## Acoustic waves

- Properties of sound waves traveling in a tube (i.e., vocal tract) are similar to those moving down a rope
  - The effect of a sound source causes air particles to move back and forth, so the wave spreads from the source
    - In some areas, particles come close together (compression) whereas in others they move further apart (rarefaction).
  - One difference is that sound waves are longitudinal whereas those in a rope are transverse, but otherwise the same mathematical model can be used for both systems

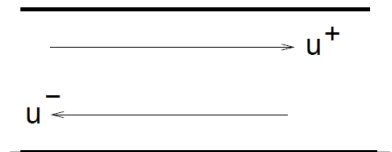


[Taylor, 2009]

## Acoustic reflection and tube models

- As with the rope, boundary conditions in the tube will determine how acoustic waves are reflected at the end of the tube
  - At certain frequencies, determined by the length of the tube and the speed of sound, the backward and forward waves will reinforce each other and cause resonances

- We can model the volume velocity (e.g., particle velocity  $\times$  area) at position  $x$  and time  $t$  as:



[Taylor, 2009]

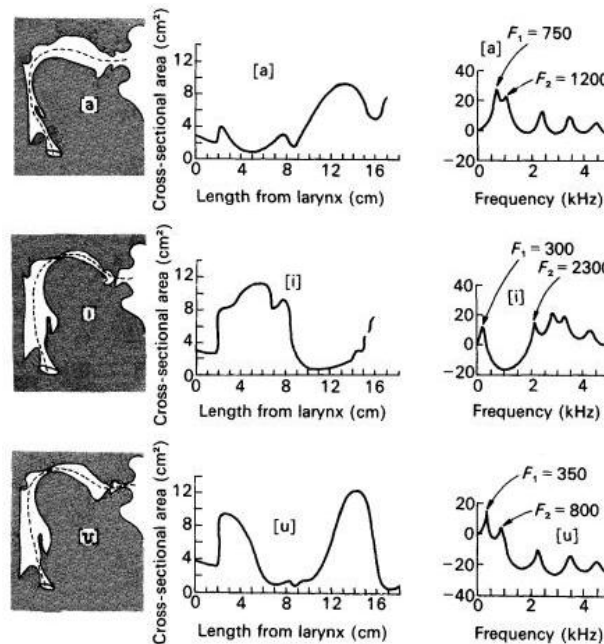
$$u(x, t) = u^+(t - x/c) - u^-(t + x/c)$$

- where  $u^+(t)$  and  $u^-(t)$  are the forward- and backward-travelling waves, and  $c$  is the speed of sound
- And the pressure becomes

$$p(x, t) = \frac{\rho c}{A} (u^+(t - x/c) + u^-(t + x/c))$$

- where  $\rho c/A$  is the characteristic impedance of the tube
- Notice how in this case the two waves add up as they meet at point  $x$

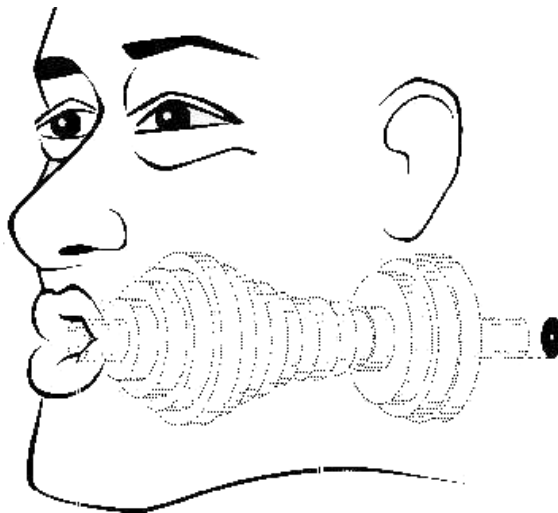
- If the area of the tube remains constant, the wave propagates through the tube
- However, if the area changes, then the impedance changes, which causes reflection, which in turn leads to standing waves, which then cause resonances
- Thus, the impedance pattern on the tube determines the resonance properties of the model



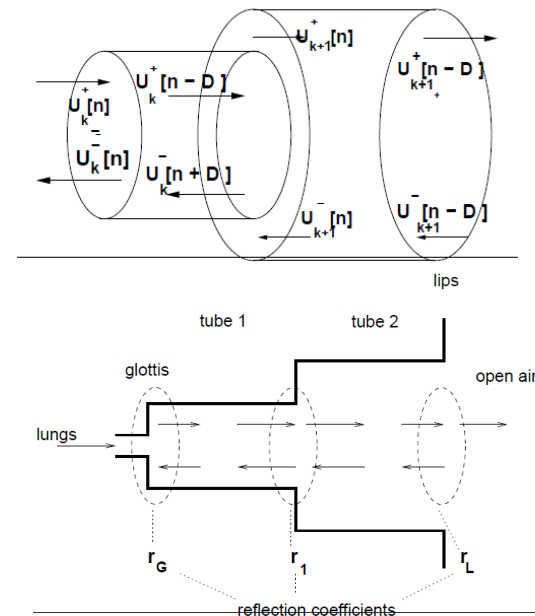
[http://www.livingcontrolsystems.com/festschrift/nevin\\_files/image015.jpg](http://www.livingcontrolsystems.com/festschrift/nevin_files/image015.jpg)



- The vocal tract can then be modeled as a series of short uniform tubes connected in series
  - By increasing the number of tubes, the vocal tract can be modeled with arbitrary accuracy
  - As we will see in linear predictive coding (lecture 7), a tube model with  $N$  sections leads to  $N/2$  resonances, so in practice only a few tube sections are needed to model the main formants in the speech signal



[http://www.gregandmel.net/burnett\\_thesis/2\\_3.ht7.jpg](http://www.gregandmel.net/burnett_thesis/2_3.ht7.jpg)



[Taylor, 2009]

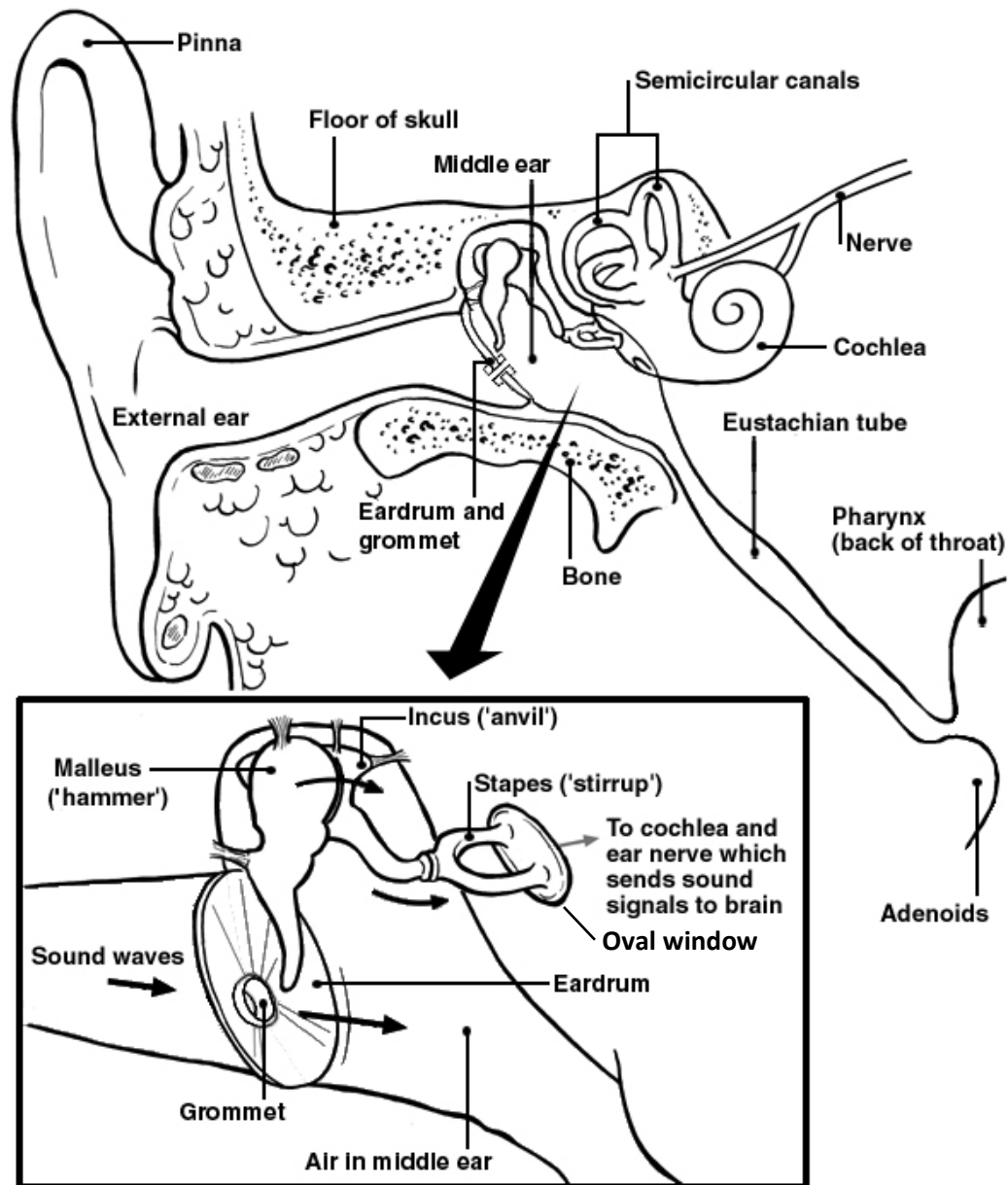
# Anatomy of the ear

## There are two major components in auditory system

- The peripheral auditory organs (the ear)
  - Converts sounds pressure into mechanical vibration patterns, which then are transformed into neuron firings
- The auditory nervous system (the brain)
  - Extracts perceptual information in various stages
- We will focus on the peripheral auditory organ

## The ear can be further divided into

- Outer ear:
  - Encompasses the pinna (outer cartilage), auditory canal, and eardrum
  - Transforms sound pressure into vibrations
- Middle ear:
  - Consists of three bones: malleus, incus and stapes
  - Transport eardrum vibrations to the inner ear
- Inner ear:
  - Consists of the cochlea
  - Transforms vibrations into spike trains at the basilar membrane



[http://www.bissy.scot.nhs.uk/master\\_code/pilsin/042.gif](http://www.bissy.scot.nhs.uk/master_code/pilsin/042.gif)

## The cochlea

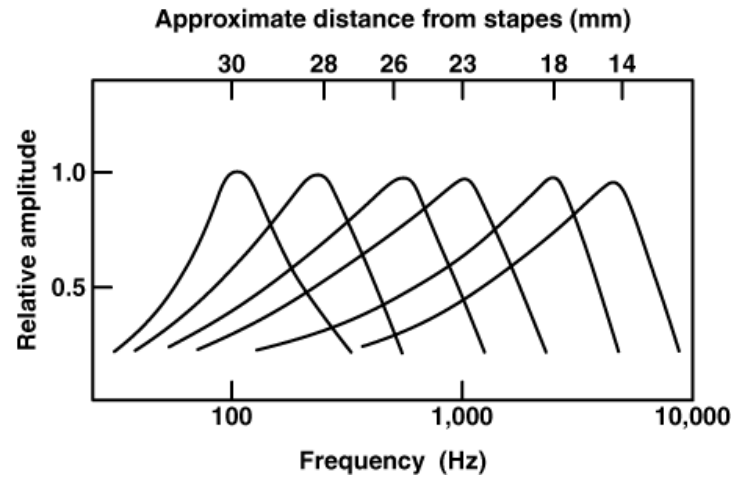
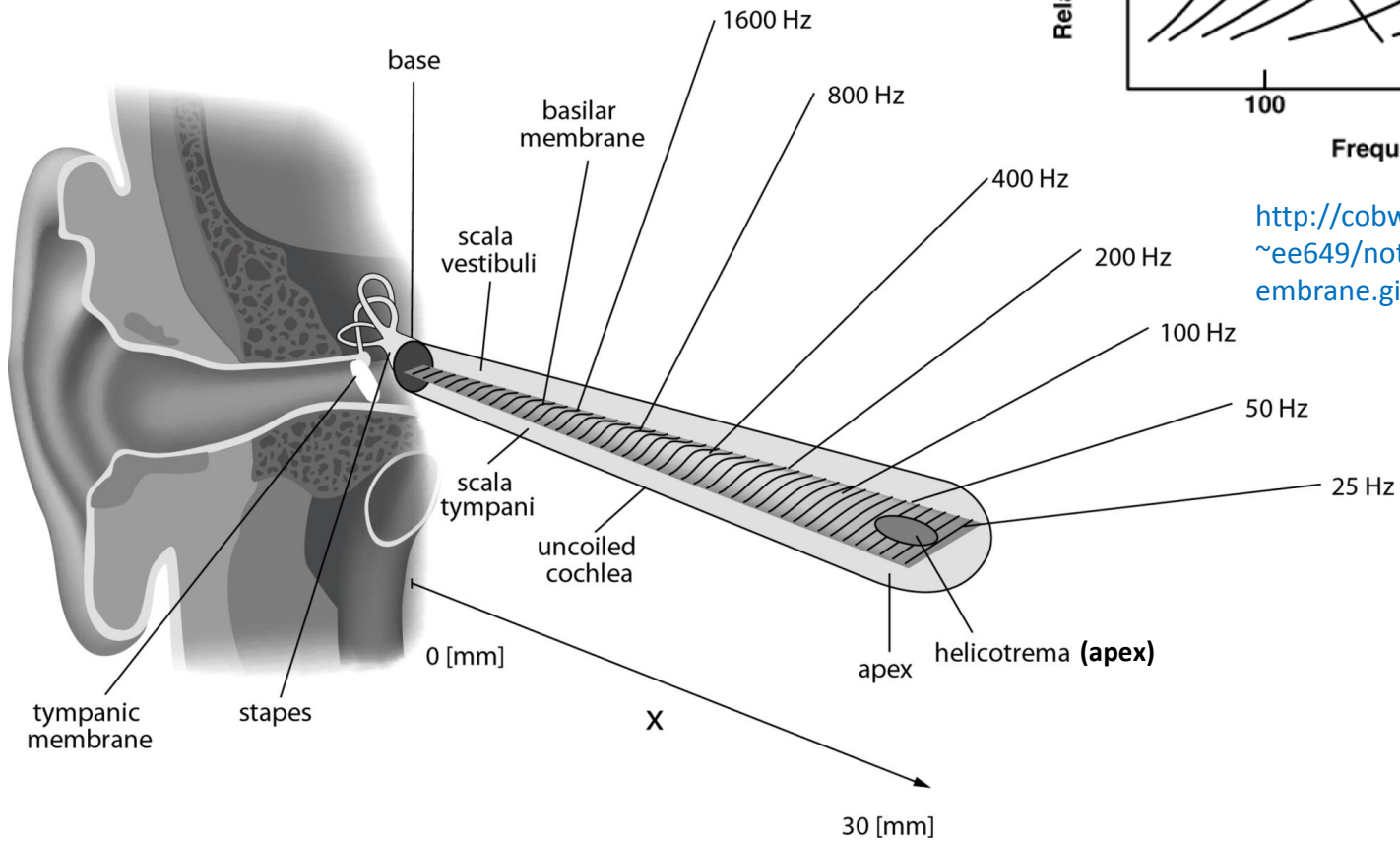
- A tube coiled in a snake-shaped spiral
- Inside filled with gelatinous fluid
- Running along its length is the basilar membrane
- Along the BM are located approx. 10,000 inner hair cells

## Signal transduction

- Vibrations of the eardrum cause movement in the oval window
- This causes a compression sound wave in the cochlear fluid
- This causes vertical vibration of basilar membrane
- This causes deflections in the inner hair cells, which then fire

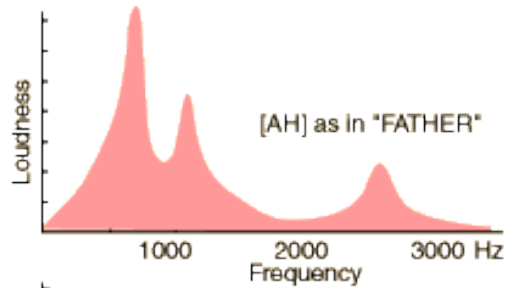
## Frequency tuning

- BM is stiff/thin at basal end (stapes), but compliant/massive at apex
- Thus, traveling waves peak at different positions along BM
- As a result, BM can be modeled as a filter bank ([video](#))

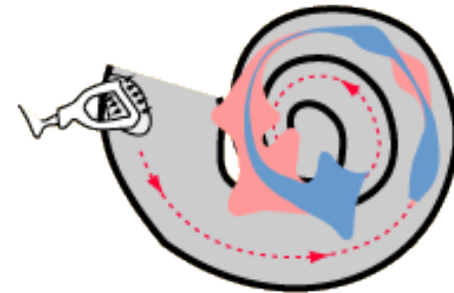
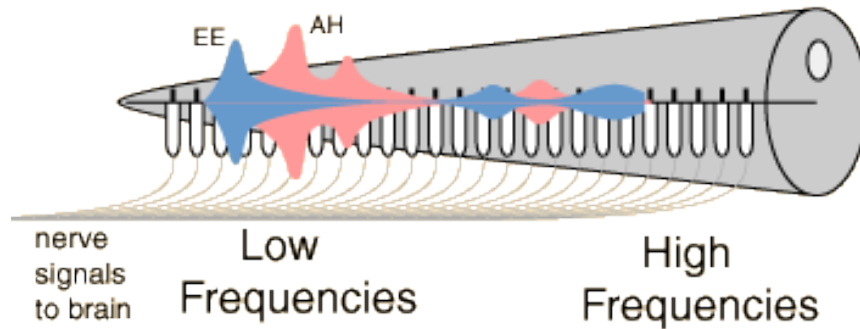
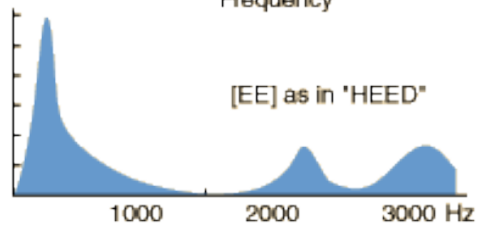


[http://cobweb.ecn.purdue.edu/~ee649/notes/figures/basilar\\_membrane.gif](http://cobweb.ecn.purdue.edu/~ee649/notes/figures/basilar_membrane.gif)

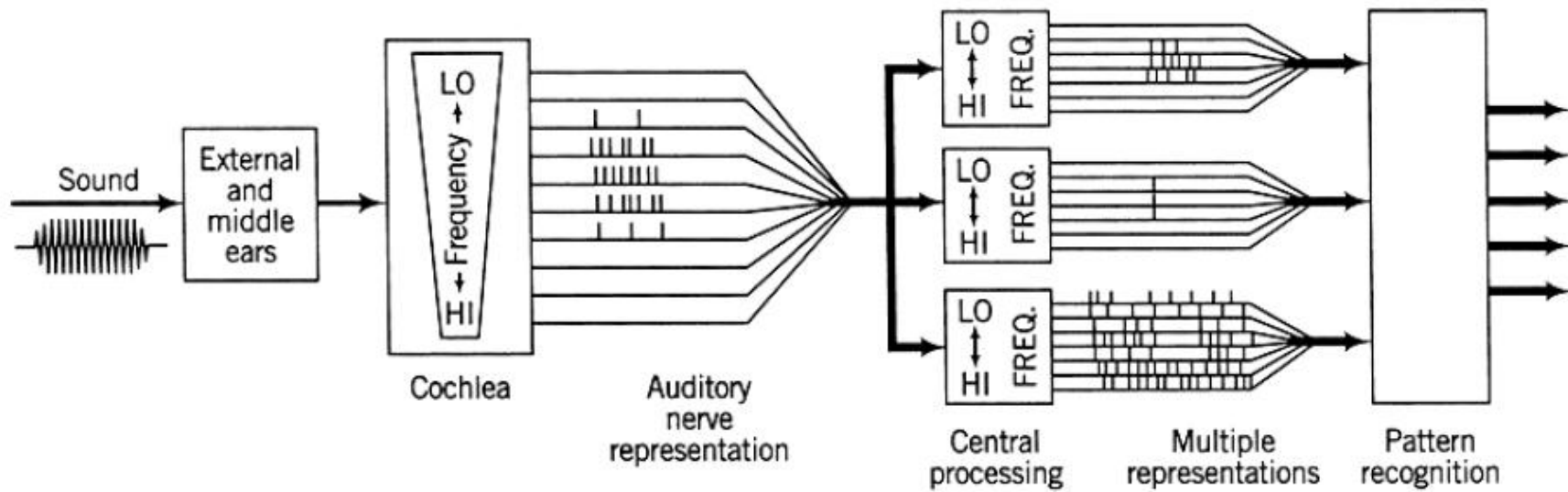
[http://upload.wikimedia.org/wikipedia/commons/6/65/Uncoiled\\_cochlea\\_with\\_basilar\\_membrane.png](http://upload.wikimedia.org/wikipedia/commons/6/65/Uncoiled_cochlea_with_basilar_membrane.png)



A conceptualization of how the ear distinguishes vowel sounds.



<http://hyperphysics.phy-astr.gsu.edu/hbase/sound/cochimp.html>

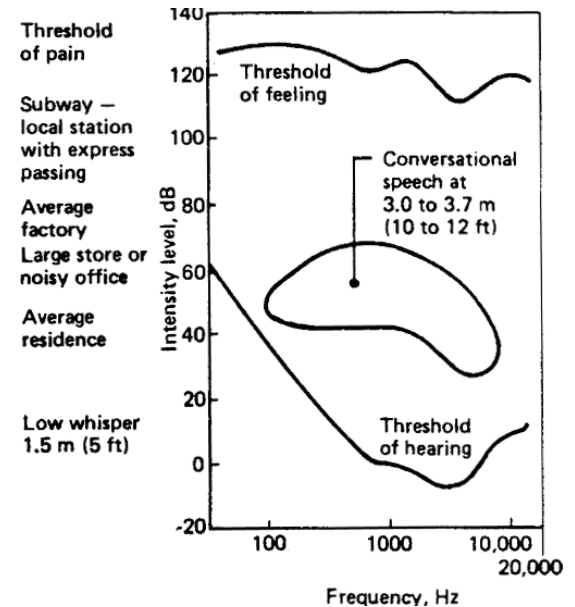


[Rabiner & Schafer, 2007]

# Auditory psychophysics

## Psychoacoustics is concerned with quantitative modeling of human auditory perception

- How does the ear respond to different intensities and frequencies?
- How well does it focus on a sound of interest in the presence of interfering sounds?



## Thresholds

<http://msis.jsc.nasa.gov/images/Section04/Image126.gif>

- The ear is capable of hearing sounds in the range of 16Hz to 18kHz
- Intensity is measured in terms of sound pressure levels (SPL) in units of decibels (dB)
- Hearing threshold: Minimum intensity at which a sound is perceived
  - Sounds below 1kHz or above 5kHz have increasingly higher thresholds
  - Threshold is nearly constant across most speech frequencies (700Hz-7kHz)

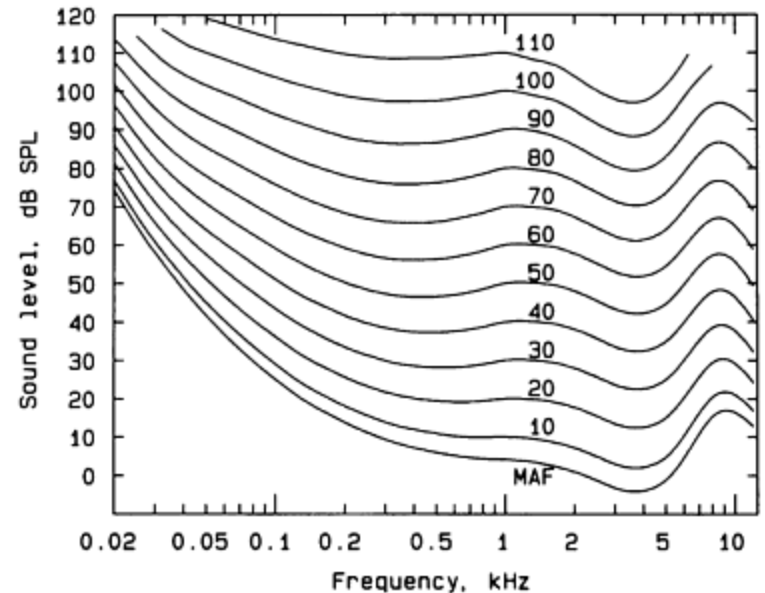


## SPL and loudness

- As with other sensory systems (seeing, smelling), auditory sensations increase logarithmically with the intensity of the stimulus
- The relation between sound pressure  $p$ , sound intensity  $I$  and loudness  $S$  follows Steven's power law

$$S \propto p^{0.6} \propto I^{0.3}$$

- where the unit of  $S$  is the *sone*, and the proportionality constant implied by the equation is frequency dependent
- The ear is most sensitive to tones around 4kHz
  - Each loudness contour corresponds to a unit of a phons (the SPL in dB of a 1kHz tone)



[http://replaygain.hydrogenaudio.org/pics/equal\\_loudness.gif](http://replaygain.hydrogenaudio.org/pics/equal_loudness.gif)

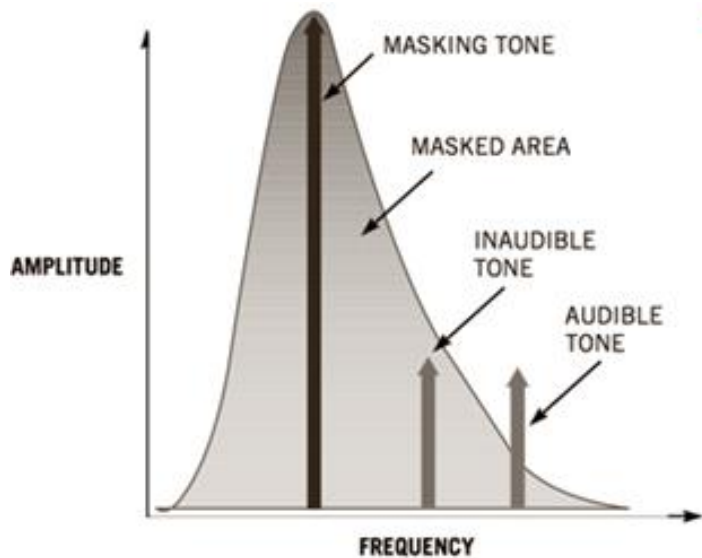
## Masking

- A phenomenon whereby the perception of a sound is obscured by the presence of another (i.e., the latter raises the threshold of the former)
- Masking is the major non-linear phenomenon that prevents treating the perception of speech sounds as a summation of responses

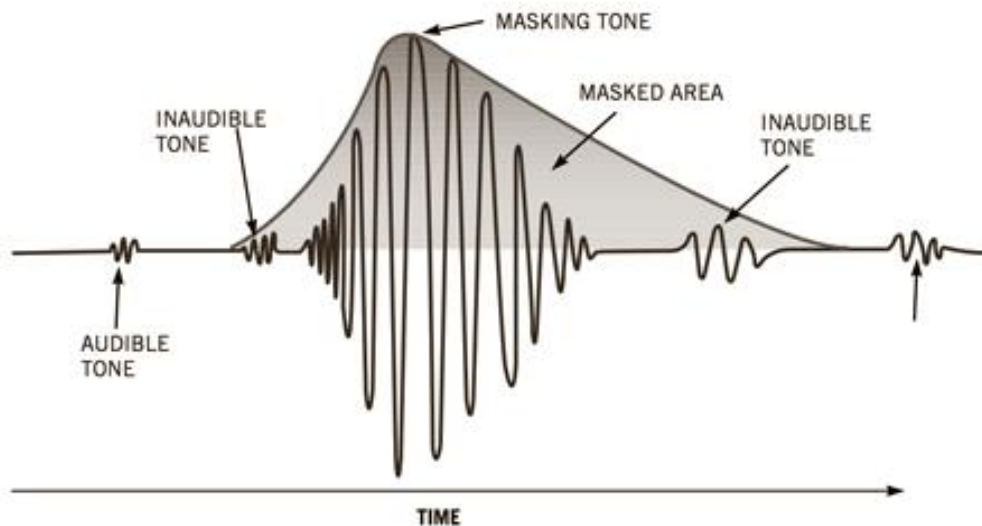
## Two types of masking phenomena

- Frequency masking
  - A lower frequency sound generally masks a higher frequency one
  - Leads to the concept of critical bands (next)
- Temporal masking
  - Sounds delayed wrt one another can cause masking of either sound
  - Pre-masking tends to last 5ms; post-masking can last up to 50-300ms

## Frequency masking



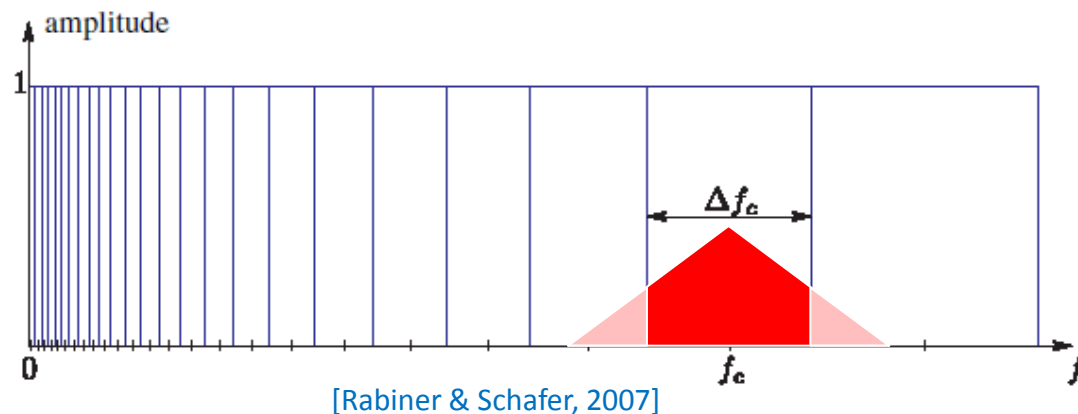
## Temporal masking



<http://homepage.mac.com/marc.heijligers/audio/ipod/compression/encoding/encoding.html>

## Critical bands

- For a given frequency, the critical band is the smallest band of frequencies around it which activate the same part of the BM
  - Critical bandwidths correspond to about 1.5 mm spacing along the BM
  - This suggests that a set of 24 bandpass filters (with increasing bandwidth with frequency) would model the BM well
- If a signal and masker are presented simultaneously, only the masker frequencies within the CB contribute to masking of the signal
  - The amount of masking is equal to the total energy of the masker within the CB of the probe



## How can you test a critical band experimentally?

- Take a band-limited noise signal with a center frequency of 2 kHz, and play it alongside a sinusoidal 2 kHz tone
- Make the tone very quiet relative to the noise
  - You will not be able to detect the tone because the noise signal will mask it
  - Now, turn up the level of the tone until you can hear it and write down its level
- Increase the bandwidth of the noise (w/o turning up its level) and repeat
  - You'll find that your threshold for detecting the tone will be higher
  - In other words, if the bandwidth of the masking signal is increased, you have to turn up the tone more in order to be able to hear it
- Increase the bandwidth and do the experiment over and over
  - As you increase the bandwidth of the masker, the detection threshold of the tone will increase up to a certain bandwidth. Then it won't increase any more!
  - This means that, for a given frequency, once you get far enough away in frequency, the noise does not contribute to the masking of the tone
- The bandwidth at which the threshold for the detection of the tone stops increasing is the critical bandwidth

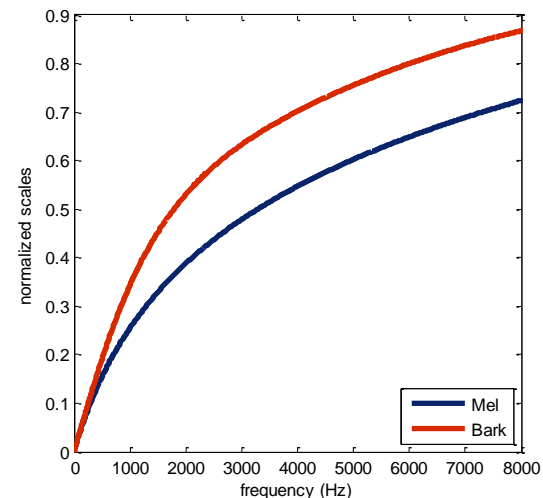
<http://www.tonmeister.ca/main/textbook/node331.html>

## Two perceptual scales have been derived from critical bands

### – Bark scale

- Relates acoustic frequency to perceptual frequency resolution
- One Bark equals one critical band

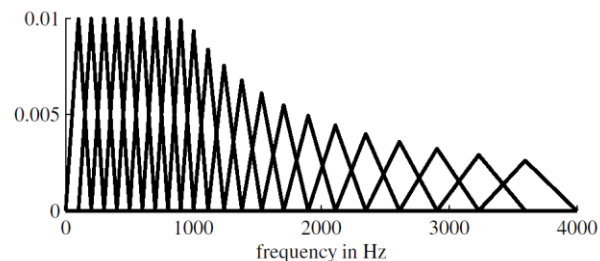
$$z = 13 \tan^{-1} \left( 0.76 \frac{f}{\text{kHz}} \right) + 3.5 \tan^{-1} \left( \frac{f}{7.5 \text{kHz}} \right)$$



### – Mel scale (more on lecture 9)

- Linear mapping up to 1 kHz, then logarithmic at higher frequencies

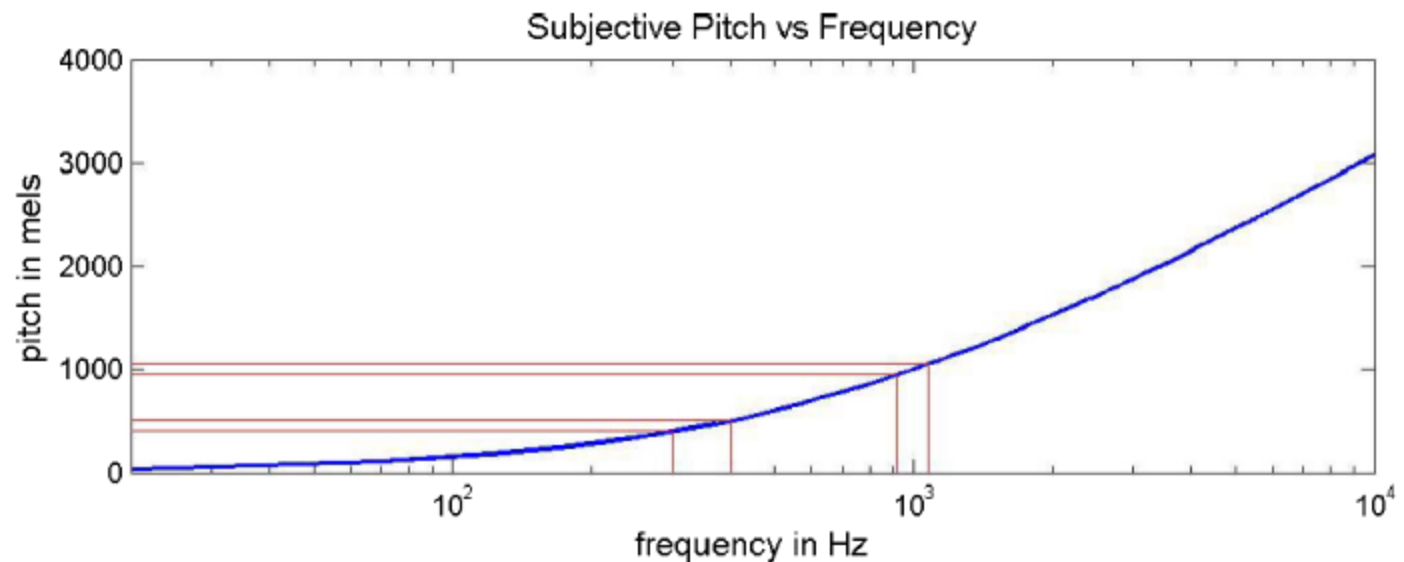
$$m = 2595 \log_{10} (1 + f/700)$$



[Rabiner & Schafer, 2007]

## Pitch perception

- Like loudness, pitch is a subjective attribute, in this case related to the fundamental frequency (F0) of a periodic signal
- The relationship between pitch and F0 is non linear and can be described by the Mel scale



[Rabiner & Schafer, 2007]