



Aalto University  
School of Science  
and Technology

# Mouth impedance optimisation for vocal tract of vowels

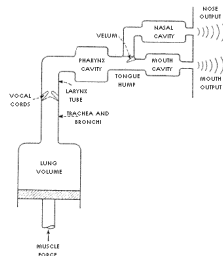
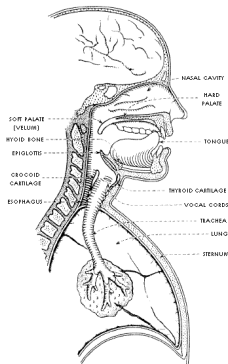
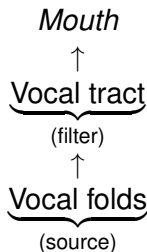
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# Human vowel production

**Vowel production:** Human speech production has traditionally been modelled with *source-filter model*



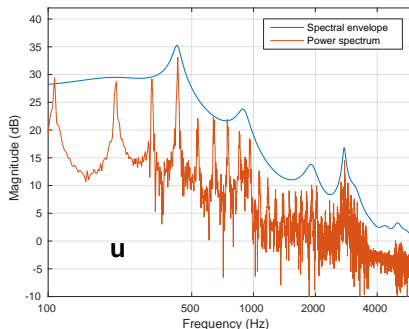
**Assumption:** Source and filter are **independent**.

Flanagan, J. L. (1972). Speech Analysis Synthesis and Perception, Springer-Verlag.

# Defining characteristic: formants

Assume that speech signal  $x[n]$  is autoregressive:

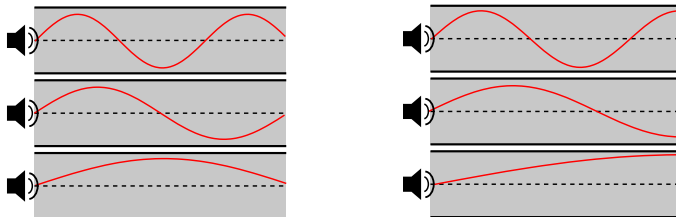
$x[n] = a_1x[n-1] + a_2x[n-2] + \dots + a_px[n-p]$ , i.e. the filter of previous slide is *all-pole*. By estimating the coefficients  $\mathbf{a}$  we can define  $H(z) = A(z)^{-1}$ , and plot  $H(i\omega)$ .



The peaks of the *spectral envelope* are called *formants*.

# Defining characteristic: resonances

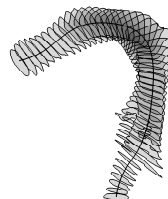
A resonator (such as glottis) inside of a cavity (such as vocal tract), will cause high amplitude oscillations at certain frequencies determined by the geometry.



These computationally obtained frequencies are called resonances.

# Determining the characteristics: data acquisition

MR Imaging → Image data → Surface model → Area functions



# Determining the characteristics: Webster's equation

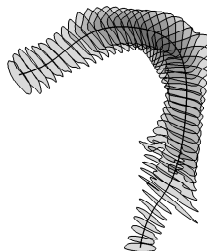
$$\lambda^2 \psi_\lambda = \frac{c^2 \Sigma(s)^2}{A(s)} \frac{\partial}{\partial s} \left( A(s) \frac{\partial \psi_\lambda}{\partial s} \right) \quad \text{for } s \in [0, \ell]$$

$\psi_\lambda$  velocity potential

$c$  speed of sound

$A(s)$  area at  $s$

$\Sigma(s)$  curvature  
correction



# Determining the characteristics: Boundary conditions

If we assume that vocal tract behaves like a semi-closed cylinder:

- ▶ Dirichlet boundary condition at open end (mouth)

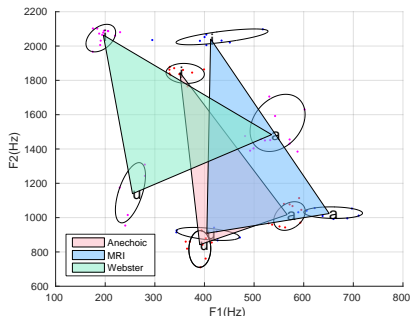
$$\frac{\partial \phi}{\partial t}(\ell, t) = 0.$$

- ▶ Neumann boundary condition at glottis:

$$c \frac{\partial \phi}{\partial \nu}(0, t) + \frac{\partial \phi}{\partial t}(0, t) = 0 \text{ to prevent energy leaking back to vocal tract.}$$

# Boundary conditions and exterior acoustics

Unfortunately, the simple assumptions won't work. The exterior space influences the acoustics heavily.





# Determining the characteristics: Webster's equation 2

We improve the boundary conditions of the equations at the mouth to include acoustic *impedance*:

$$\left\{ \begin{array}{l} \left( \frac{\lambda_\theta^2}{c^2 \Sigma(s)^2} + \frac{2\pi\alpha W(s)\lambda_\theta}{A(s)} \right) \psi_{\lambda_\theta} = \frac{1}{A(s)} \frac{\partial}{\partial s} \left( A(s) \frac{\partial \psi_{\lambda_\theta}}{\partial s} \right) \quad \text{on } [0, \ell] \\ \left( \frac{\lambda_\theta}{c} \right) \psi_{\lambda_\theta}(0) - \frac{\partial \psi_{\lambda_\theta}}{\partial s}(0) = 0, \\ \left( \frac{\lambda_\theta}{c} \right) \psi_{\lambda_\theta}(\ell) + \theta \frac{\partial \psi_{\lambda_\theta}}{\partial s}(\ell) = 0, \end{array} \right. \quad \theta = \nu + i\eta.$$

Unfortunately, determining the value of  $\theta$  through measurements is impossible, so it will have to be determined computationally.

# Motivation for boundary condition

Arnold Sommerfeld defined a boundary condition for Helmholtz equation that forces the energy from source to scatter into the infinity, and thus prevents the "energy from infinity" to be radiated back into the field.

$$\left( \frac{\partial}{\partial |x|} - ik \right) u(x) = 0.$$

The boundary condition employed by us is actually a lossy version of the Sommerfeld boundary condition

$$\left( \frac{\partial}{\partial s} + \frac{\lambda_\theta}{\nu + i\eta} \right) \psi_\theta = 0.$$

# Optimisation: setup

**Goal:** We want to match the three first resonances produced by Webster's equation to the first three formants measured from the speech signal.

We have one parameter to optimise,  $\theta$  in the boundary term

$$\left(\frac{\lambda_\theta}{c}\right) \psi_{\lambda_\theta}(\ell) + \theta \frac{\partial \psi_{\lambda_\theta}}{\partial s}(\ell)$$

There are some issues pertaining to optimisation

- ▶ Three objectives far apart in frequency range.
- ▶ We are essentially interpolating boundary condition from Dirichlet to Neumann, which will cause a change in wavenumber at certain values of  $\theta$

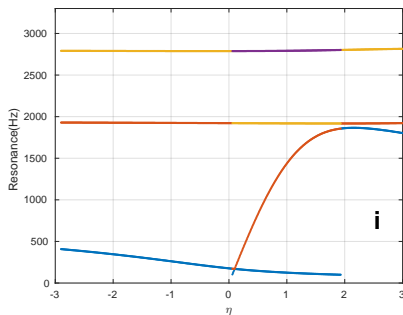
# Optimisation: implementation

Since discrepancies in formant frequencies are measured in semitones, the first issue is solved by using an objective function  $f$  to reflect this:

$$f(\theta) = \sum_{j=1}^3 \left| \log_2 \left( \frac{R_j(\theta)}{F_j} \right) \right|.$$

# Optimisation: implementation

Fundamental change in the type of boundary condition can cause the wavenumber of the waveform to change.



Solved by determining the feasible areas manually, and imposing constraints for optimisation

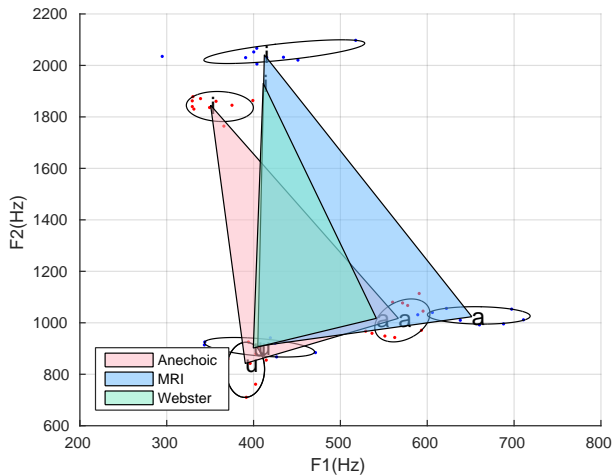
# Results:Discrepancy

After optimisation we measure the discrepancies in semitones for the first three resonances and formants:

$$D_j = 12 \log_2 (R_j(\theta_{opt})/F_j)$$

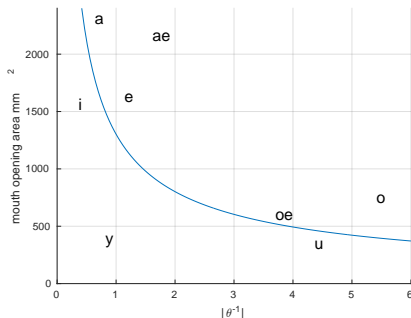
|       | [a]  | [e] | [i]  | [o] | [u] | [y]  | [æ] | [œ] | abs. avg |
|-------|------|-----|------|-----|-----|------|-----|-----|----------|
| $D_1$ | -0.8 | 0.0 | 0.0  | 0.0 | 0.0 | 0.0  | 0.0 | 0.0 | 0.1      |
| $D_2$ | 0.0  | 0.0 | -0.9 | 0.0 | 0.0 | -0.7 | 1.8 | 2.2 | 0.7      |
| $D_3$ | -3.0 | 1.1 | 0.0  | 3.5 | 1.4 | 1.8  | 2.8 | 2.3 | 2.0      |

# Results:Discrepancies



# Relation between $\theta$ and geometry

Impedance is a measure of how much the motion induced by pressure applied to a surface is impeded. The assumption is that the optimal impedance is somehow tied to the inverse of the mouth opening.





# The End

Questions?

`http://speech.math.aalto.fi`