

# System Theory of Speech

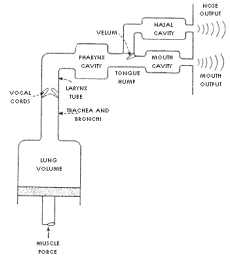
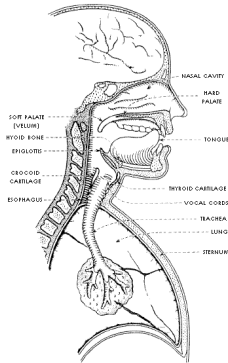
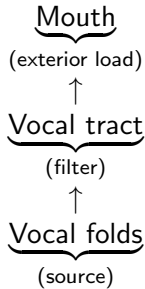
Antti Hannukainen, **Jarmo Malinen**, Antti Ojalamm

Aalto University, School of Science,  
Department of Mathematics and Systems Analysis

Lorentz Center  
May 23-26, Leiden

# Human voice production

## Simplified vowel production:



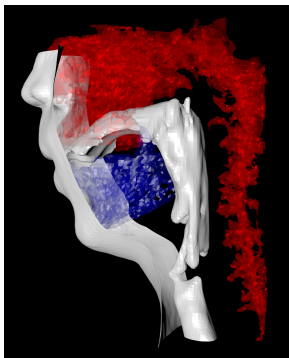
Flanagan, J. L. (1972). Speech Analysis Synthesis and Perception, Springer-Verlag.

## Notable facts:

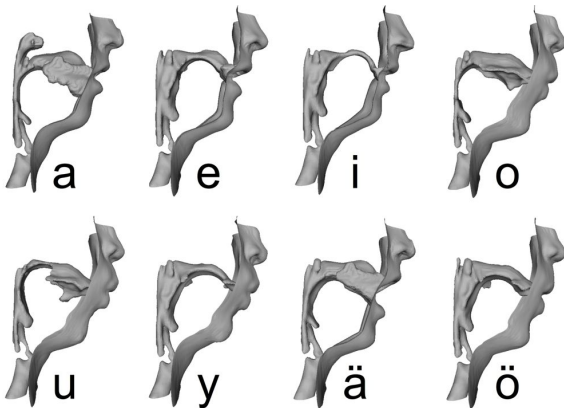
- Vocal tract (VT) shape changes, and there are feedbacks.
- Not all speech sounds originate in vocal folds.

# Modelling speech requires data

- Simultaneous speech recording during 3D MR imaging.
- Geometry for the computational model is constructed from MR images by custom software.

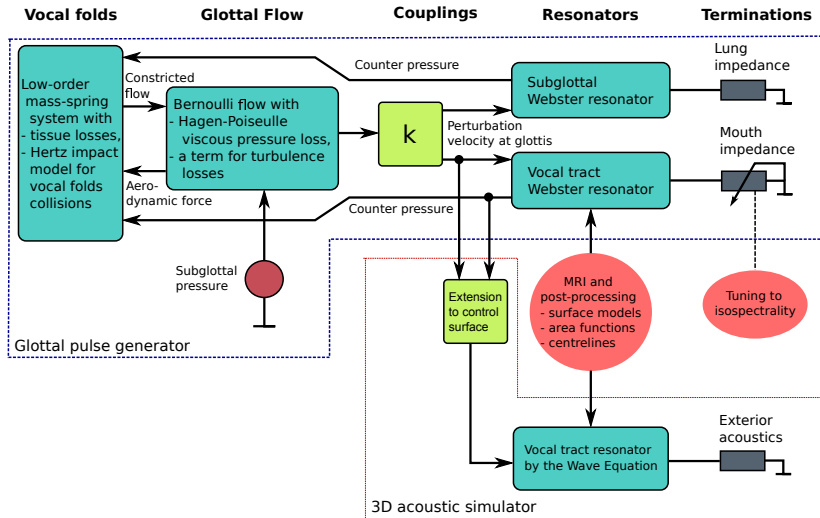


## Geometries of Finnish vowels



PDE's of acoustics should be solved in these domains.

# Multiphysics of vowel production, Dico



## Wave equation model (“Dirichlet mouth”)

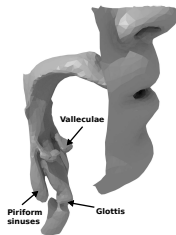
Equations for the velocity potential  $\phi = \phi(\mathbf{r}, t)$ :

$$\left\{ \begin{array}{ll} \phi_{tt} = c^2 \Delta \phi & \text{in VT volume } \Omega \\ \phi(\mathbf{r}, t) = 0 & \text{at mouth opening } \Gamma(\ell) \\ \frac{\partial \phi}{\partial \nu}(\mathbf{r}, t) + \alpha \phi_t(\mathbf{r}, t) = 0 & \text{on VT walls } \Gamma \\ c \frac{\partial \phi}{\partial \nu}(\mathbf{r}, t) + \phi_t(\mathbf{r}, t) = 2 \sqrt{\frac{c}{\rho A(0)}} u(\mathbf{r}, t) & \text{at vocal folds } \Gamma(0). \end{array} \right.$$

This is a passive boundary node (with output omitted).

- $c$  speed of sound
- $\rho$  density of air
- $\alpha$  boundary dissipation coefficient
- $\nu$  exterior normal

$A(0)$  area of  $\Gamma(0)$



## Cheaper model for tubular domains?

Let  $\Omega \subset \mathbb{R}^3$  be a variable diameter, curved tube. Now, is there an approximate equation for the averages

$$\bar{\phi}(s, t) := \frac{1}{A(s)} \int_{\Gamma(s)} \phi dA \quad \text{for } s \in [0, \ell]$$

of the velocity potential  $\phi$  given by the wave equation on  $\Omega$ ?

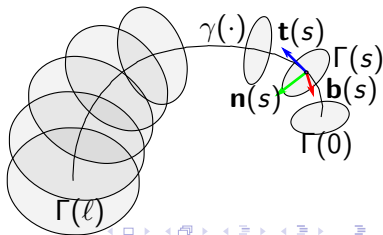
YES, the generalised Webster's horn model  
for longitudinal dynamics!

$\ell$  length of  $\Omega$

$\gamma(\cdot)$  centreline of  $\Omega$

$\Gamma(s)$  slice of  $\Omega$ , normal  
to  $\gamma(\cdot)$  at  $s$

$A(s)$  area of  $\Gamma(s)$



## Webster's lossy resonator

Equations for the Webster's velocity potential  $\psi = \psi(s, t)$ :

$$\begin{cases} \psi_{tt} = \frac{c(s)^2}{A(s)} \frac{\partial}{\partial s} \left( A(s) \frac{\partial \psi}{\partial s} \right) - \frac{2\pi\alpha W(s)c(s)^2}{A(s)} \frac{\partial \psi}{\partial t} & \text{in vocal tract } s \in [0, \ell] \\ \psi(\ell, t) = 0 & \text{at mouth } s = \ell \\ -c\psi_s(0, t) + \psi_t(0, t) = 2\sqrt{\frac{c}{\rho A(0)}} \tilde{u}(t) & \text{on vocal folds } s = 0. \end{cases}$$

This is a passive **strong** boundary node (with output omitted).

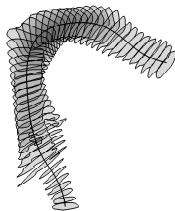
$c, \rho, \alpha$  as above

$\ell$  length of the VT

$A(s)$  area at  $s \in [0, \ell]$

$\Sigma(s)$  curvature correction

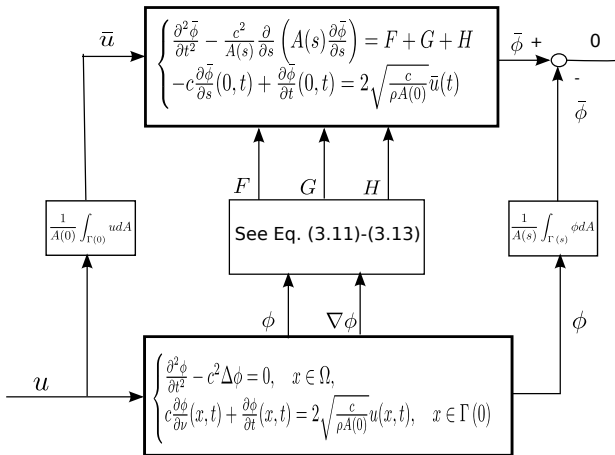
$W(s)$  stretching correction



From now on, we restrict ourselves to the conservative case  $\alpha = 0$ .

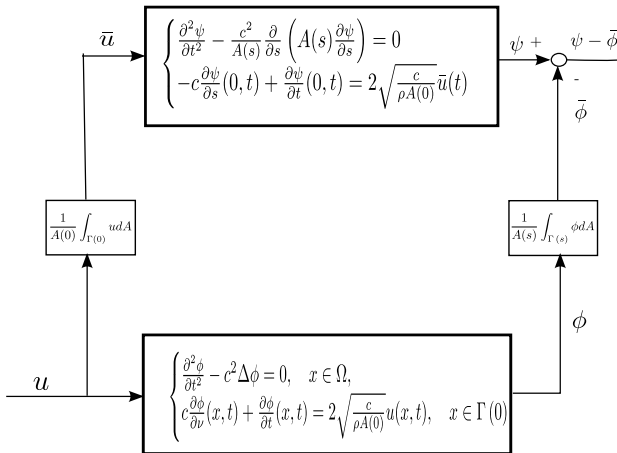


## Approximation by Webster's model? (1)



Don't worry about the formulas for functions  $F, G, H$ .

## Approximation by Webster's model? (2)

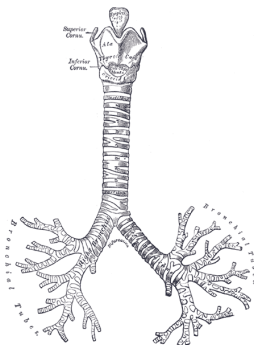


To make a long story short:  $F + G + H \rightarrow 0$  as  $\phi - \bar{\phi} \rightarrow 0$ , giving an *a posteriori* estimate for the approximation error  $\psi - \bar{\phi}$ .

## Transmission graphs

Any finite number of passive strong boundary nodes can be coupled to a *transmission graph* that is passive and internally well-posed as well.

Treatment of  
the subglottal acoustics  
using Webster's model  
on subdividing bronchi,  
bronchioles, and alveoli?



We just use Webster's model for exponential horn in "Dico".

## Resonance equations

*Ceteris paribus*, the measured resonance structure from vowel sounds should match the computed resonances from the model.

Wave Equation  $\rightarrow$  **Helmholtz equation:**

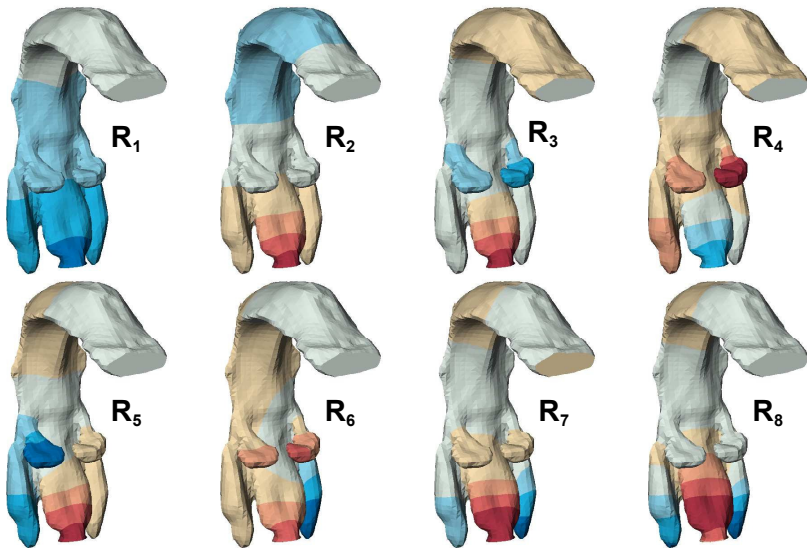
$$\lambda^2 \Phi_\lambda = c^2 \Delta \Phi_\lambda \quad \text{in VT volume } \Omega.$$

Webster's Equation  $\rightarrow$  **time-independent Webster:**

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

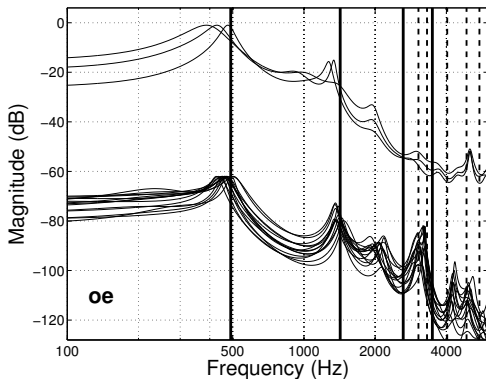
- The boundary conditions for the time-variant PDE give the corresponding boundary conditions of the resonance PDE.
- Discrete resonance frequencies:  $R = \frac{1}{2\pi} \operatorname{Im}(\lambda)$ .

## Helmholtz mode shapes $\Phi_\lambda$ for [oe]



It seems a general fact that first three are purely longitudinal.

## Matching measurements and computations

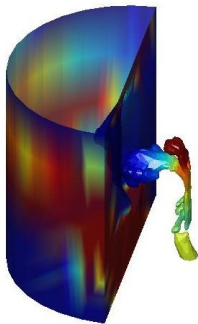


- Vertical lines: Helmholtz resonances with “Dirichlet mouth”.
- Curve families: Spectral envelopes from recorded speech.  
The upper during MRI, the lower in anechoic chamber.

## Exterior acoustics (1)

Until now, the exterior space acoustic have been omitted, and the Dirichlet boundary condition at mouth has been used instead.

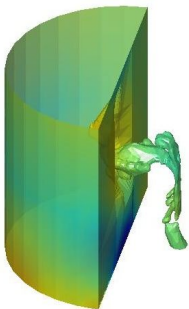
The mixed resonance of a nasal [ɑ] at 1625Hz. Both the vocal tract and the idealised, semi-cylindrical exterior domain ( $d = 30$  cm) are excited.



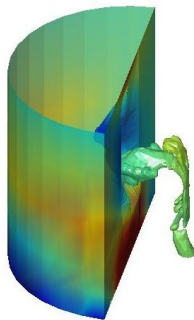
Neglecting the exterior acoustics leads to a frequency-dependent discrepancy of  $\approx 2.5$  semi-tones between VT resonance measurements from speech and Helmholtz computations.

## Exterior acoustics (2)

For speech, we need “High Fidelity” in the vocal tract volume but in the exterior acoustic space, “Low Adultery” will suffice.



The mixed resonance of [a] is found at 1625Hz when using 8900 D.o.F. for the exterior domain.



The mixed resonance of [a] is found at 1637Hz when using 26 D.o.F. for the exterior domain.



## Exterior acoustics (3)

Typical numbers of exterior space reduction for the Helmholtz problem:

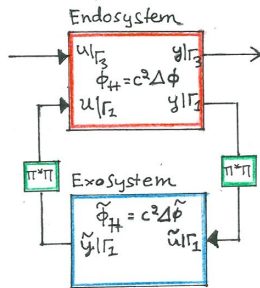
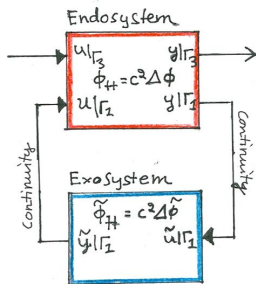
	# of tetr. F.E.	D.o.F	Reduced D.o.F.
Vocal tract	115000	26600	26600
Exterior space	38500	8900	26

The dimension reduction  $8900 \rightarrow 26$  in degrees-of-freedom of the exterior acoustics produces an error of  $\approx 0.8$  semi-tones in the three lowest pure resonances  $R_1$ ,  $R_2$ , and  $R_3$  of the vocal tract.

“Pure” vocal tract resonance means that the exterior acoustic space is not significantly excited.

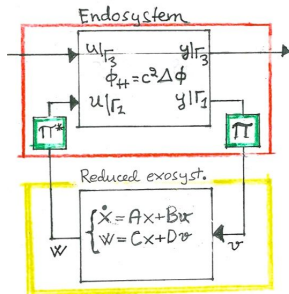
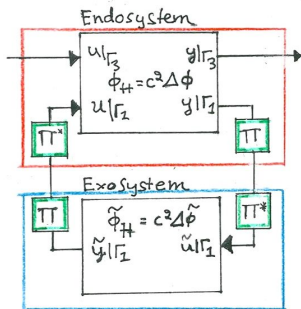
## Partial dimension reduction (1)

Let us start with a dissipative BCS that is first splitted spatially into two subdomains: interior and exterior.



- $\Pi : L^2(\Gamma_1) \rightarrow \mathbb{C}^n$  is a finite rank co-isometry. For example, it may map to averages on disjoint parts of the interface  $\Gamma_1$ .
- The orthogonal projection  $\Pi^* \Pi$  removes energy from the feedback loop, thus preserving passivity.

## Partial dimension reduction (2)



- The new endosystem has finite-dimensional internal input and output spaces.
- Finally, the exosystem is replaced by a finite-dimensional approximate system.

# Conclusions

- Mathematics is difficult.
- Applications require a lot of hard work.
- Applied mathematics is difficult and requires a lot of hard work.

# “Opera magna”



A. Hannukainen, T. Lukkari, J. Malinen, and P. Palo.

Vowel formants from the wave equation. *Journal of the Acoustical Society of America*, 122(1):EL1–EL7, 2007.



A. Aalto, D. Aalto, J. Malinen, and M. Vainio.

Modal locking between vocal fold and vocal tract oscillations. *arXiv:1211.4788 (submitted)*, 2013.



A. Aalto and J. Malinen.

Composition of passive boundary control systems. *Mathematical Control and Related Fields*, 3(1):1–19, 2013.



T. Lukkari and J. Malinen.

Webster’s equation with curvature and dissipation. *arXiv:1204.4075 (submitted)*, 2013.



A. Aalto, T. Lukkari, and J. Malinen.

Acoustic wave guides as infinite-dimensional dynamical systems. *ESAIM: Control, Optimisation and Calculus of Variations (to appear)*, 2014.



D. Aalto, O. Aaltonen, R.-P. Happonen, P. Jääsaari, A. Kivelä, J. Kuortti, J. M. Luukinen, J. Malinen, T. Murtola, R. Parkkola, J. Saunavaara, and M. Vainio.

Large scale data acquisition of simultaneous MRI and speech. *Applied Acoustics (to appear)*, 2014.

The End

Thanks for your patience.  
Any questions?

<http://speech.math.aalto.fi>