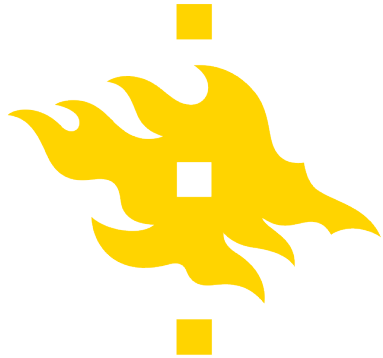




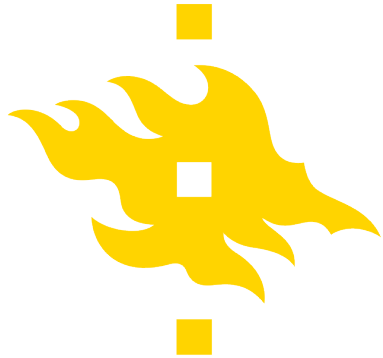
# Mathematical modeling of speech acoustics

D. Sc. Daniel Aalto



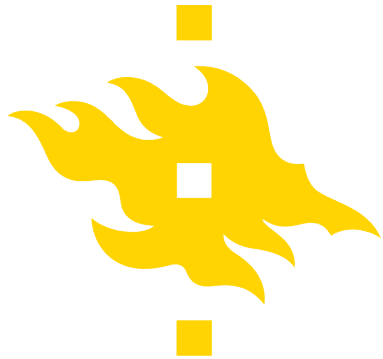
## Ultimate goal

Predict the **speech** outcome  
of oral and maxillofacial  
surgery patients



## How to reach the goal?

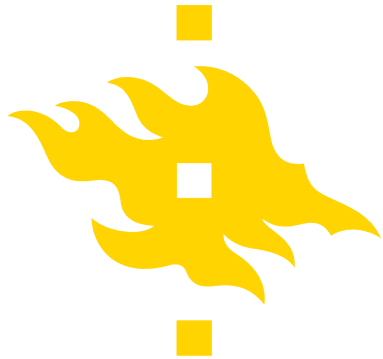
- By synthesizing the speech of a **virtually** operated vocal tract



## This talk

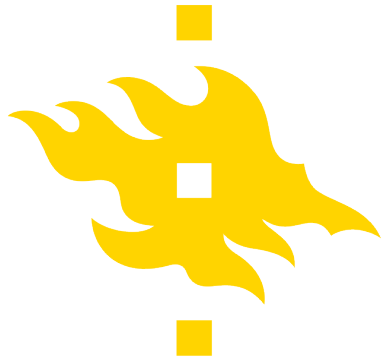
- Orthognathic patients and model validation
- Objective measurement of speech acoustics
- Presentation of the computational vowel model





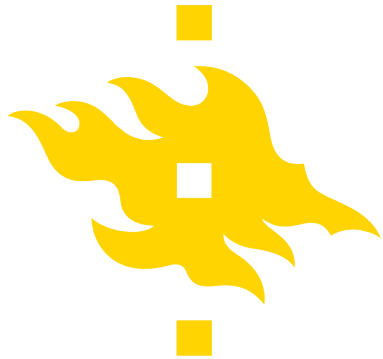
# Orthognathic patient data I

- Anatomic changes are predictable  
(advancement of mandible and/or maxilla)
- Comparison of measured acoustics and  
computed speech characteristics from the MR  
images
- Comparison of the prediction and the real  
speech outcome



## Orthognathic patient data II

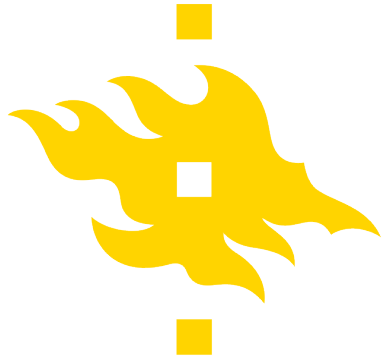
- 20 (10 women, 10 men) patients undergoing an orthognathic treatment in Turku are enrolled
- so far: 6 pre-treatment recordings
- 70 sustained sound productions (10 s) for each patient
- 12 short sentences
- Measurable changes in formants (Niemi et al. 2006)



## Orthognathic patient data III



- Phonetically rich sentences
- Vowels occur in phonetically controlled contexts
- Coarticulation and motility in sagittal videos
- Changes in vowel space are predicted



# What is speech for?

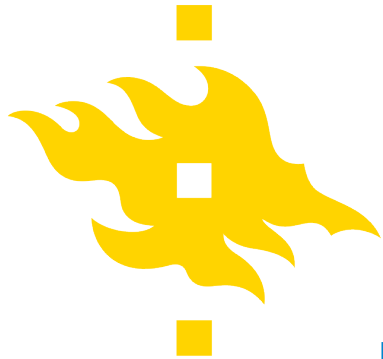
Linguistic code:

Communicating the “thoughts” of a person through language e.g. “Mom, do pharaohs exist?”

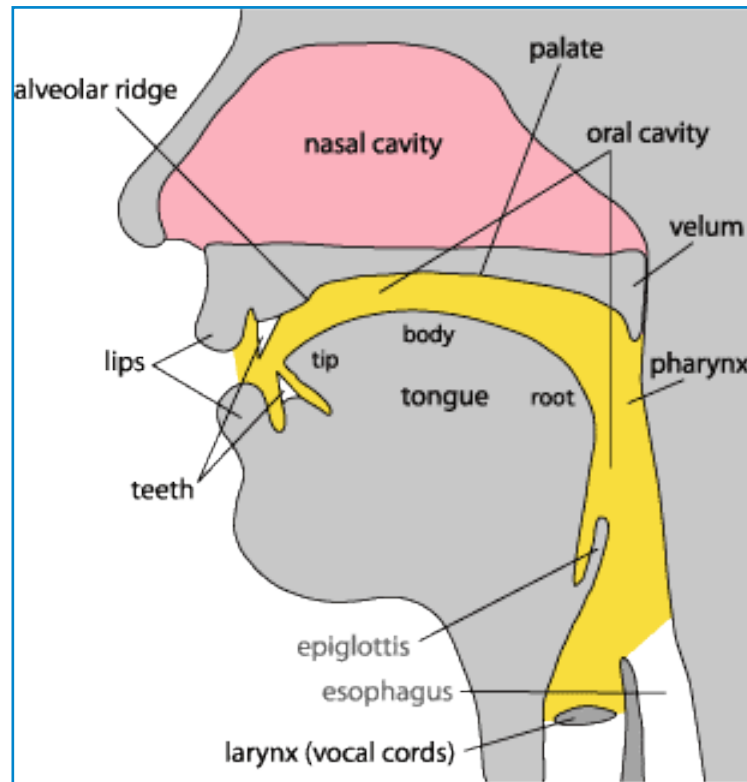
Biological code:

The speaker reveals information about him/herself e.g. the speaker sounds assertive, healthy, happy, tired, 5-6yo boy, speaker of Finnish (Turku dialect)

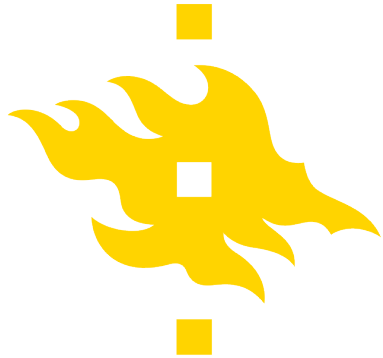




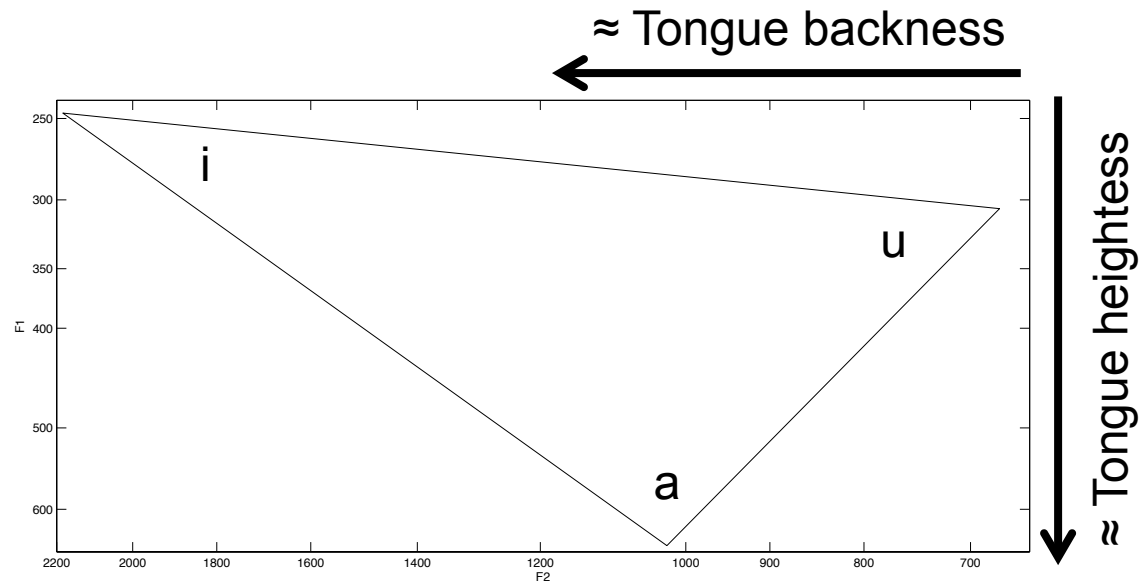
# Vocal tract resonances



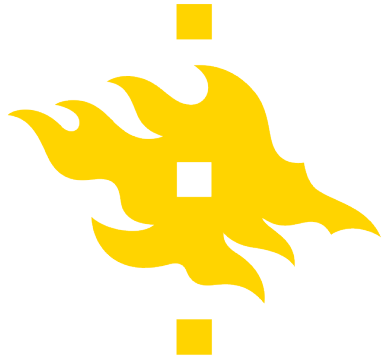
Thanks to:  
A. Suni, T. Raitio, P. Alku



# Vowel space: Formants



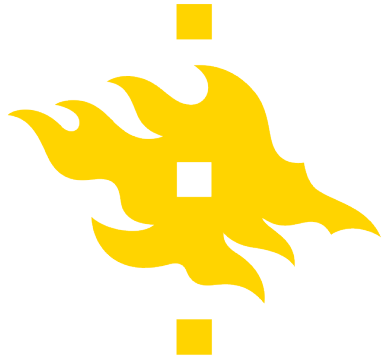
- Size of the vowel space correlates with intelligibility
- In addition, vowel formants provide information of the speaker



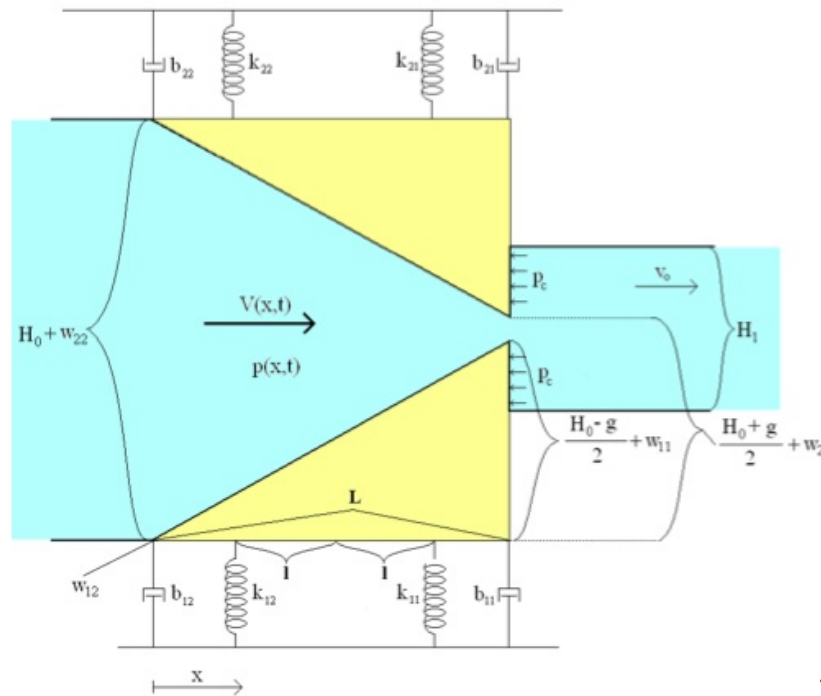
# Dico: modeling speech acoustics

An integrated vowel acoustics model:

- 3D-image is transformed to a sound!
- A mechanical model for vocal folds
- An acoustic model for the air vibrations inside the vocal tract
- Interaction between vocal folds and vocal tract
- Model = simplified reality!



# Dico: Submodel for vocal folds



Vocal fold movement:

$$\begin{cases} M_1 \ddot{W}_1(t) + B_1 \dot{W}_1(t) + PK_1 W_1(t) = -F(t), \\ M_2 \ddot{W}_2(t) + B_2 \dot{W}_2(t) + PK_2 W_2(t) = F(t) \end{cases}$$

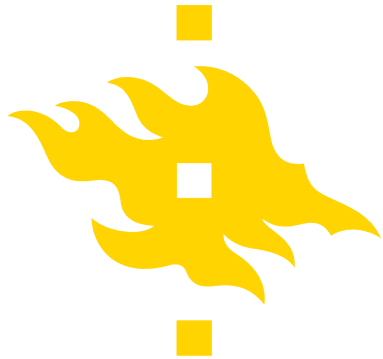
Air flow through glottis:

$$p_{sub} = \underbrace{\hat{C}_{iner} \dot{v}_o(t)}_{\text{inertive pressure}} + \underbrace{\frac{C_g}{\Delta W_1(t)} v_o(t)}_{\text{viscous pressure loss}}$$

Vocal tract impact:

$$\begin{cases} \frac{\partial^2 \Psi(x, t)}{\partial t^2} = \frac{c^2}{A(x)} \frac{\partial}{\partial x} \left( A(x) \frac{\partial \Psi(x, t)}{\partial x} \right), & x \in [0, L_{VT}], \\ \Psi_x(0, t) = -v_o(t), \\ \Psi_t(L_{VT}, t) + \theta c \Psi_x(L_{VT}, t) = 0, \\ p_c(t) = \rho \Psi_t(0, t). \end{cases}$$

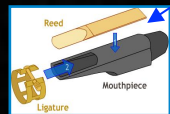
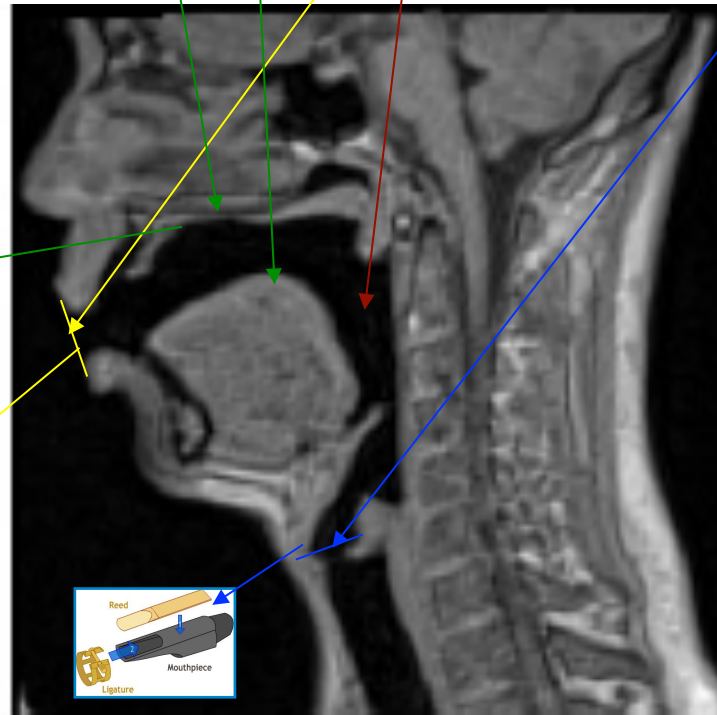




# Dico: Acoustic equations

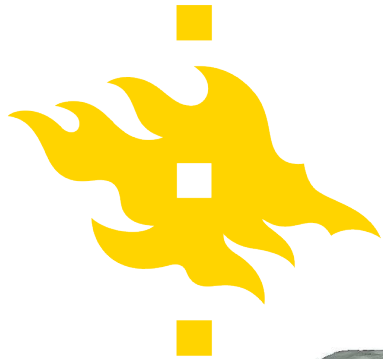
$$\left\{ \begin{array}{l} \Phi_{tt} = c^2 \Delta \Phi \text{ on } \Omega, \quad \Phi = 0 \text{ on } \Gamma_1, \\ \frac{\partial \Phi}{\partial \nu} = 0 \text{ on } \Gamma_2, \quad \Phi_t + c \frac{\partial \Phi}{\partial \nu} = 2 \sqrt{\frac{c}{\rho_0}} u \text{ on } \Gamma_3, \end{array} \right.$$

$\Phi$  = virtual sound

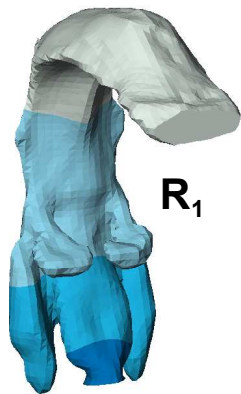


$$\lambda^2 \int_{\Omega} p_{\lambda} \phi d\Omega + \lambda_c \int_{\Gamma_3} p_{\lambda} \phi d\omega + c^2 \int_{\Omega} \nabla p_{\lambda} \cdot \nabla \phi d\Omega = 0$$

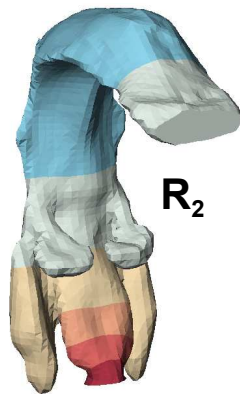
$\lambda$  = Formant/resonance frequency



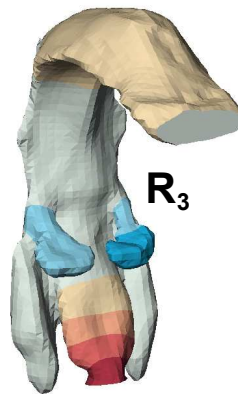
# Dico: Solving the equations



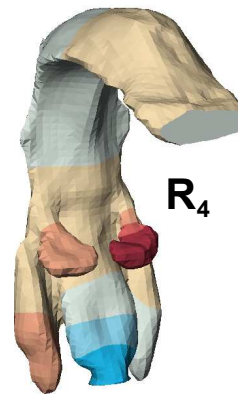
$R_1$



$R_2$

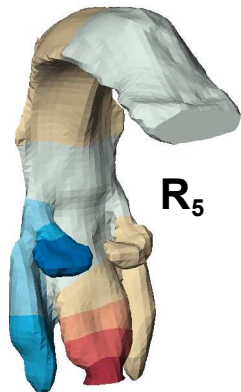


$R_3$

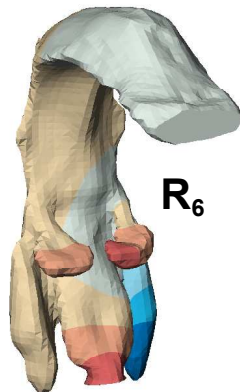


$R_4$

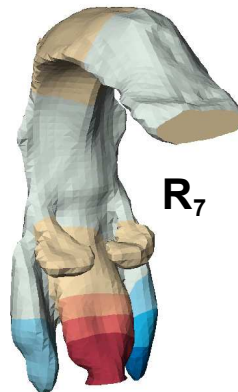
Computed  
standing  
waves



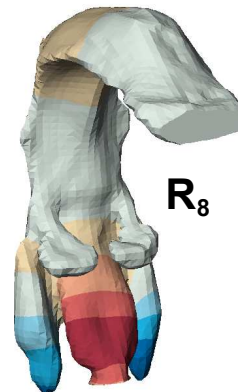
$R_5$



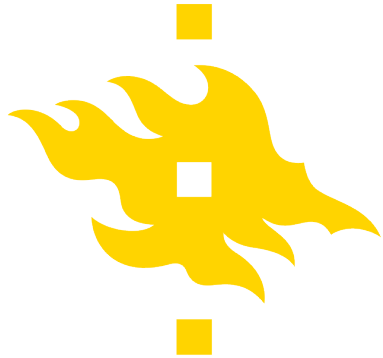
$R_6$



$R_7$



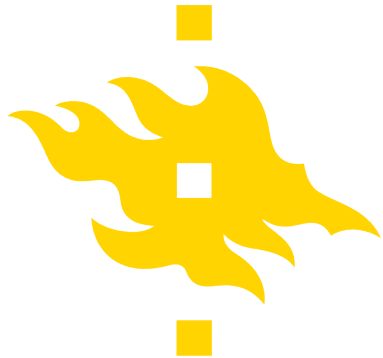
$R_8$



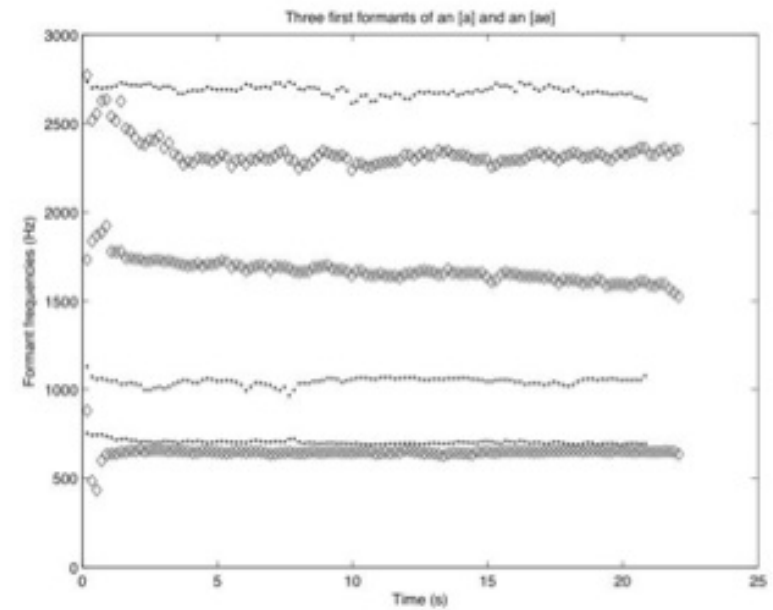
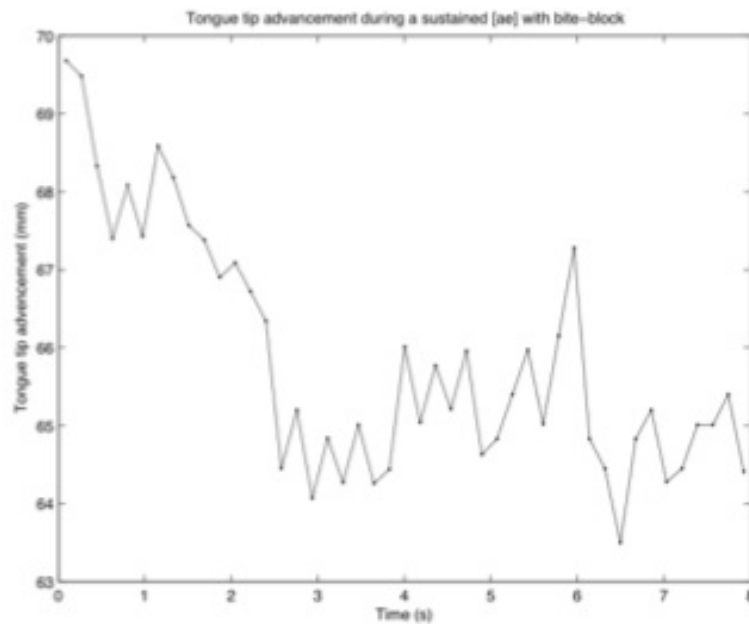
# Validation details

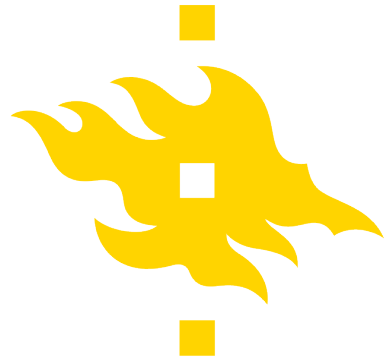


- Are we solving the right equations?
- Possible error sources:
  - Instabilities in sustained vowel production
  - Spatial inaccuracies in MRI and image processing
  - Room acoustics, measurement equipment, noise cancellation

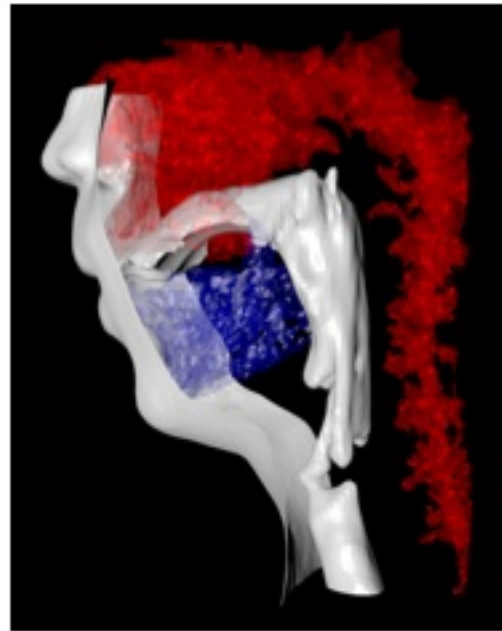
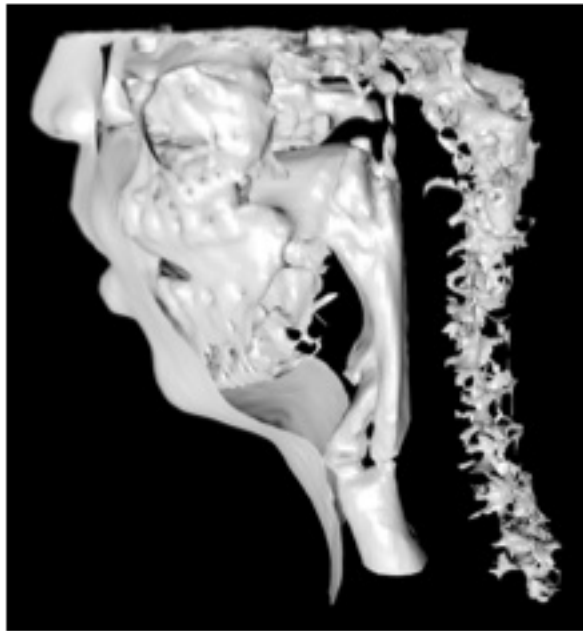


# Vowel production stability





# Image processing



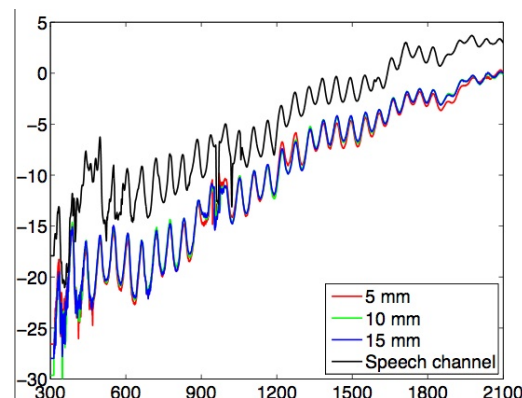
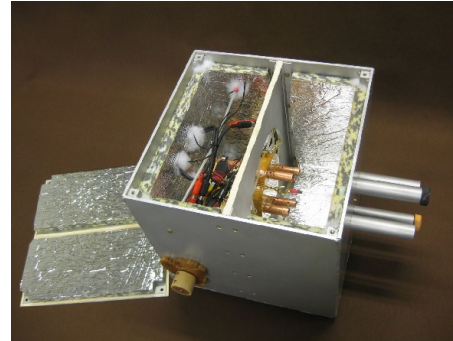
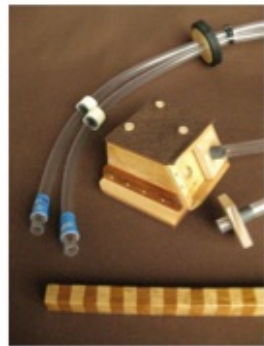
- Semi automatic volume detection
- Point Cloud Library
- Teeth superposition
- Surface model

Aalto, et al. 2013



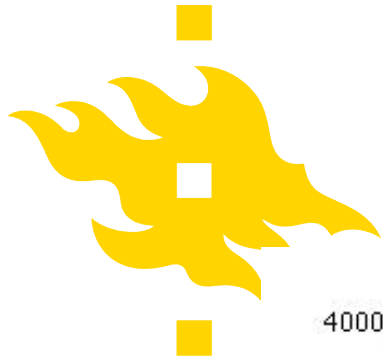


# Sound recording

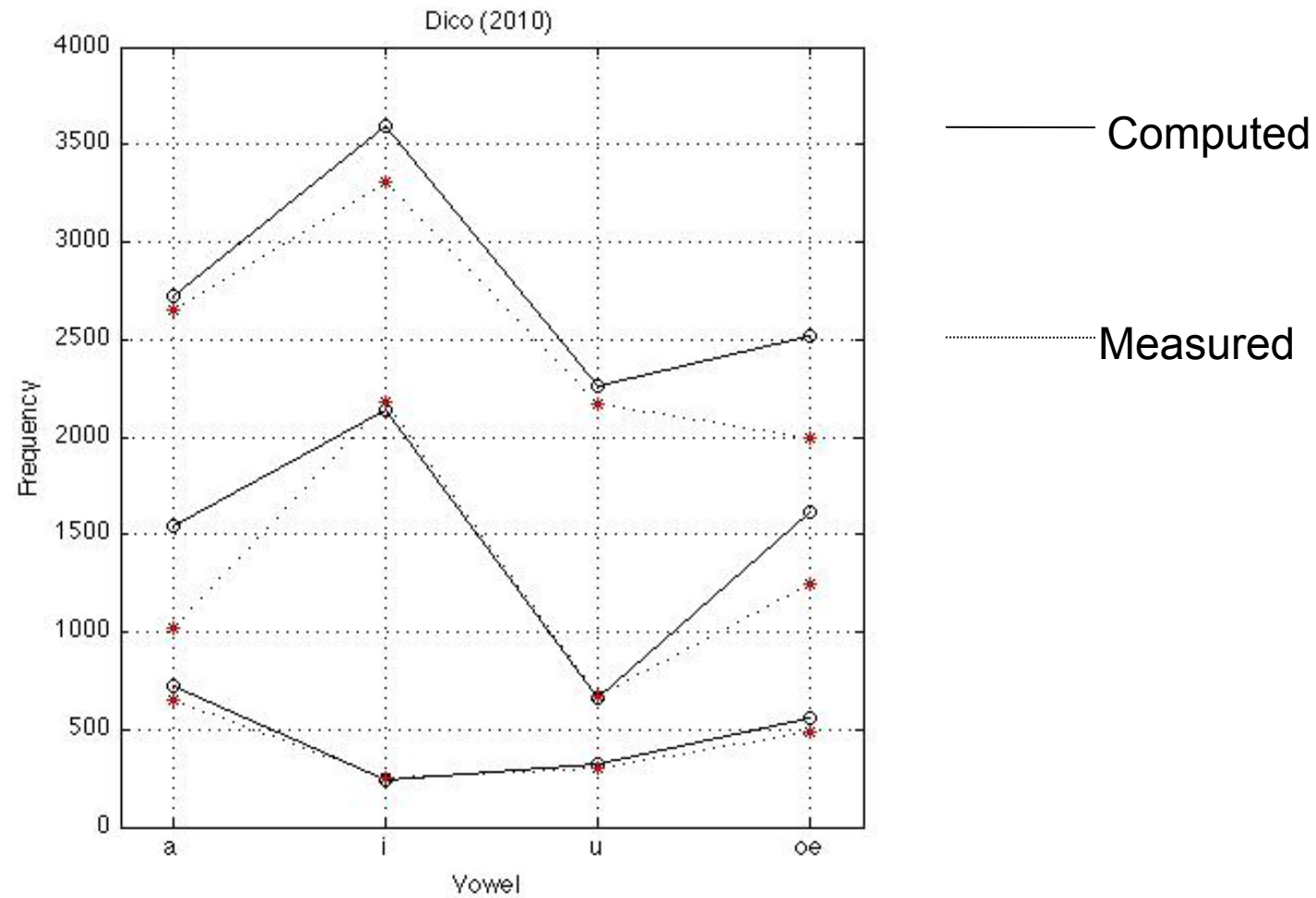


- Compensation for sound deformations due to the wave guides
- Noise cancellation
- Room acoustics still challenging

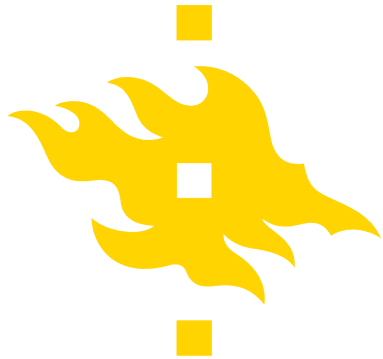




# First results (pilot data)

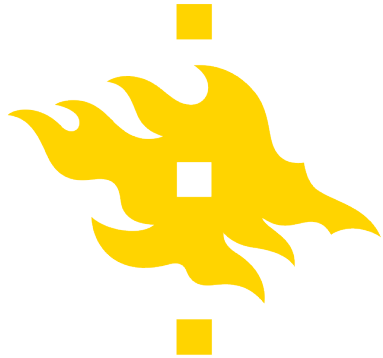






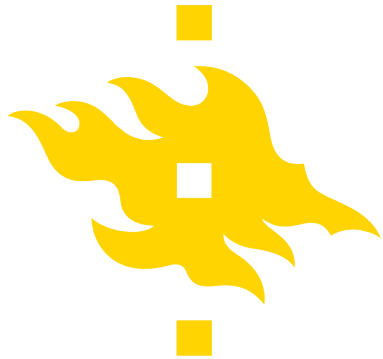
## Next steps

- Model improvement: lip boundary
- Complete analysis of the data
- Predictions for the post-op conditions
- Extending the methods to other patient groups
- Mobility analysis based on mid-sagittal videos
- Sensitivity analysis based on 3D geometries
- Visualization by multicolored 3D-prints



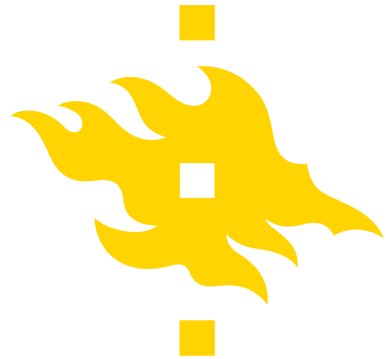
# Generalizability of the approach

- The model is based on anatomy and physics: potential for reliable simulation of the vocal tracts independent of age, sex, ethnic group
- Model focuses on the passage from anatomy to acoustics: feasible for most patient groups
- Here the data is Finnish but every language in the world contains several vowels
- Some consonants are also captured by the model



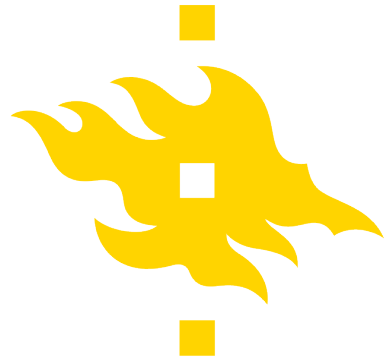
## Future questions

- Combining precise anatomical images (MRI) with moving vocal tract videos, could we pre-synthesize the speech following any surgery?
- Could a speech synthesizer be **personalized** to sound like the patients' own voice (e.g. cerebral palsy patients) based on the anatomy of the vocal tract?
- Could we predict the post-op **intelligibility** and/or **ease of articulation** of a patient undergoing oral and maxillofacial surgery?

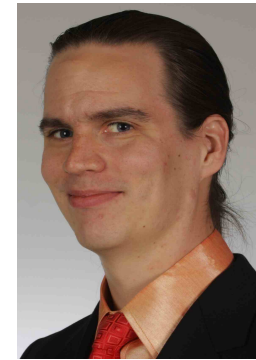


# University of Turku & Turku University Hospital



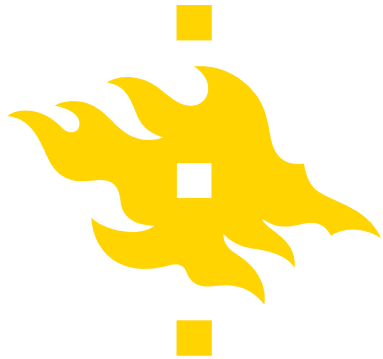


# University of Helsinki



# Aalto University





# Thanks!

