



Segmentation of the Vocal Tract in Magnetic Resonance Images using Deformable Models

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6th

World Congress on Biomechanics

in conjunction with

14th International Conference on Biomedical Engineering (ICBME) &
5th Asian Pacific Conference on Biomechanics (APBiomech)



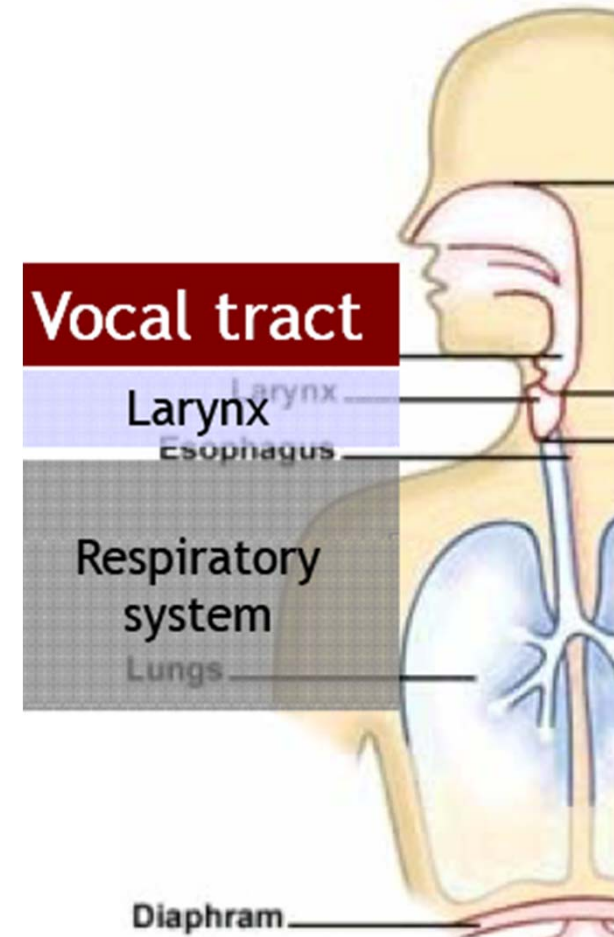
Outline

- Introduction
 - Speech production, Vocal tract, Goals
- Data and Methods
 - MRI protocol, Speech corpus, Vocal tract's shape modelling (PDM - Point Distribution Model – Building process), Vocal tract's shape segmentation (ASM - Active Shape Model and AAM - Active Appearance Model)
- Results
 - Landmark points, Modes of variation, Segmentation
- Conclusions



Introduction: Speech production

- Speech production involves complex and individual mechanisms
- It includes three main steps
 - Respiration
(air supply – Activation)
 - Phonation
(sound origin – Vibration)
 - Articulation
(sound modulation – Articulation and Resonance)

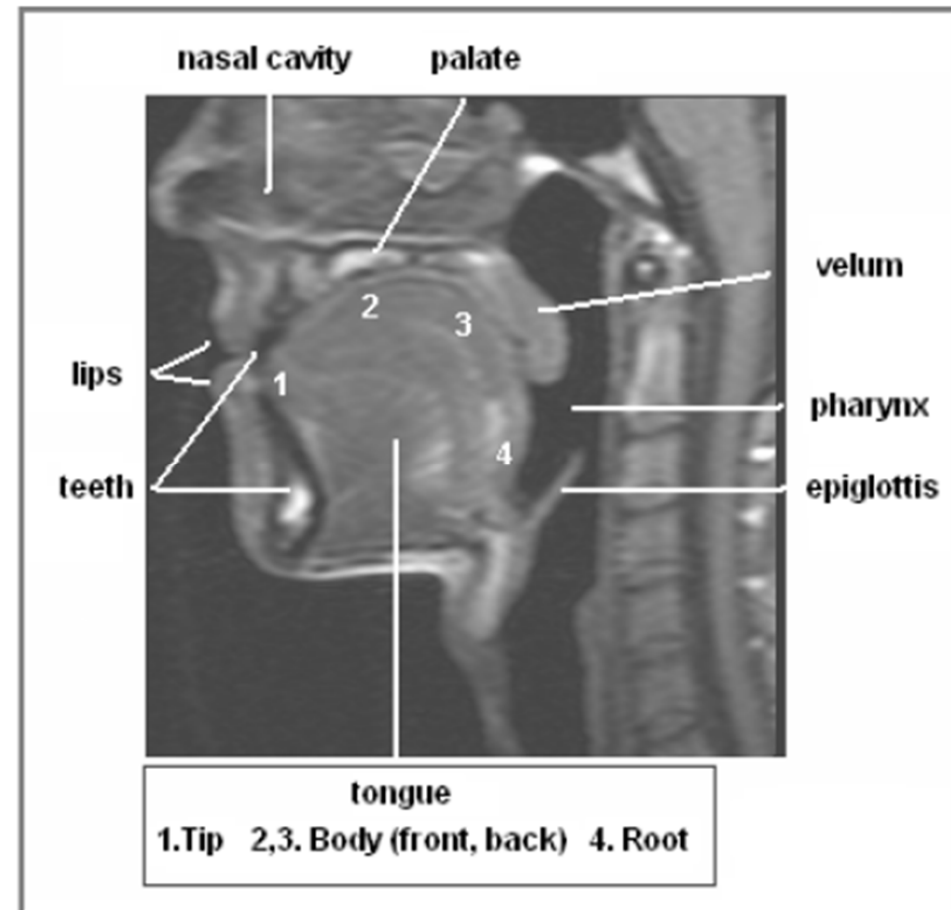


Ventura et al. (2009), Application of MRI and Biomedical Engineering in Speech Production Study, Computer Methods in Biomechanics and Biomedical Engineering 12(6):671-681



Introduction: Vocal Tract

- Main shape features
 - Non-linear shape (“L-shaped tube”)
 - Significant length
- Articulators’ behavior
 - passive (i.e. palate, pharynx)
 - active (i.e. tongue, lips, velum)



Ventura et al. (2010), Towards Dynamic Magnetic Resonance Imaging of the Vocal Tract during Speech Production, Journal of Voice, doi:10.1016/j.jvoice.2010.01.014 (in press)



Introduction: Goals

- **Characterize and further reconstruct the vocal tract during the articulation of (25) European Portuguese sounds** by using techniques of image processing and analysis on magnetic resonance images
- **Automatically segment the vocal tract** in magnetic resonance images



Data and Methods

- Image acquisition
 - Siemens Magnetom Symphony 1.5T system
 - Head array coil
- Speech corpus
 - One training subject (male) in supine position, without speech disorders
 - Twenty five European Portuguese sounds



Vasconcelos et al. (2010), Towards the Automatic Study of the Vocal Tract from Magnetic Resonance Images, Journal of Voice, doi:10.1016/j.jvoice.2010.05.002 (in press)



Data and Methods: MRI protocol

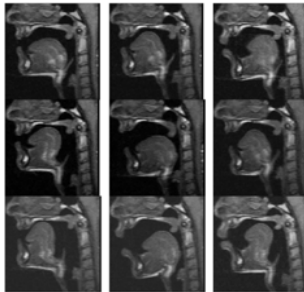
- Slices in sagittal orientation
- T1-weighted images using Turbo Spin Echo sequences
- Time acquisition: 10 sec. (compromise between image resolution and time for sustained articulation tolerable by the subject)
- Static study (sustained articulation during acquisition)
- One image was acquired per each sound (25)

Ventura et al. (2009), Application of MRI and Biomedical Engineering in Speech Production Study, Computer Methods in Biomechanics and Biomedical Engineering 12(6):671-681



Data and Methods: Point Distribution Model (Building process)

Training set (21 images)



**(N) Objects sampled by
a set of n (25) landmark
points**

**Building the vector of
landmark points' co-
ordinates:**

$$x_i = (x_{i1}, \dots, x_{in}, y_{i1}, \dots, y_{in})^T$$

with $i = 1 \dots N$

**Pontual Distribution
Model**

$$x = \bar{x} + Pb$$

with P the matrix with the
first t eigen-vectors, and b
the vector of weights for
each variation mode

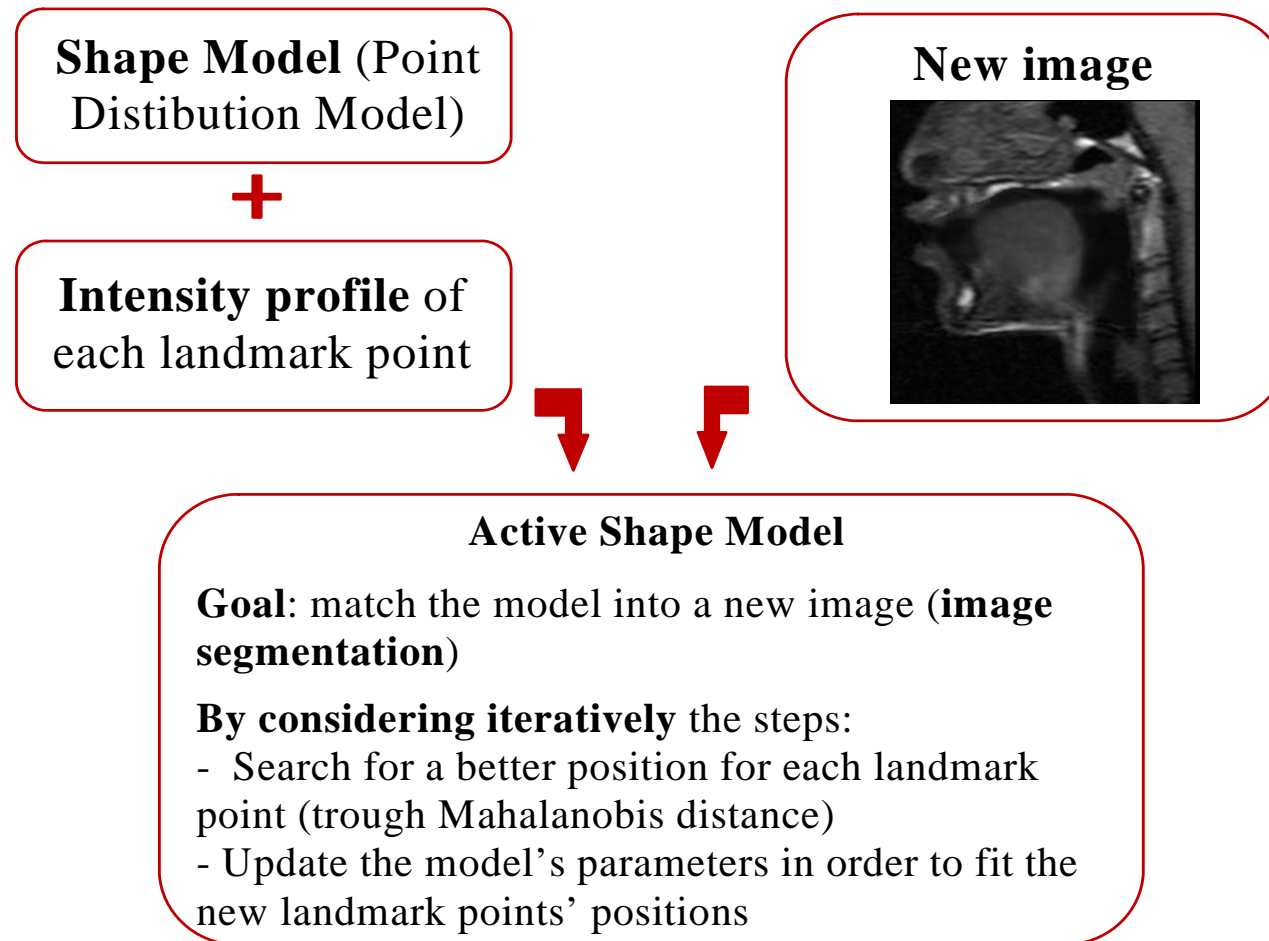
**Compute the mean shape
(\bar{x}) and the variation
modes (by applying a
Principal Component
Analysis on the landmark
points' co-ordinates**

**Rigid registration of all
objects in the training
set (considering rotation,
translation and scale)**

Vasconcelos et al. (2008), *Methods to Automatically Built Point Distribution Models for Objects like Hand Palms and Faces Represented in Images*, *Computer Modeling in Engineering & Sciences* 36(3):213-241



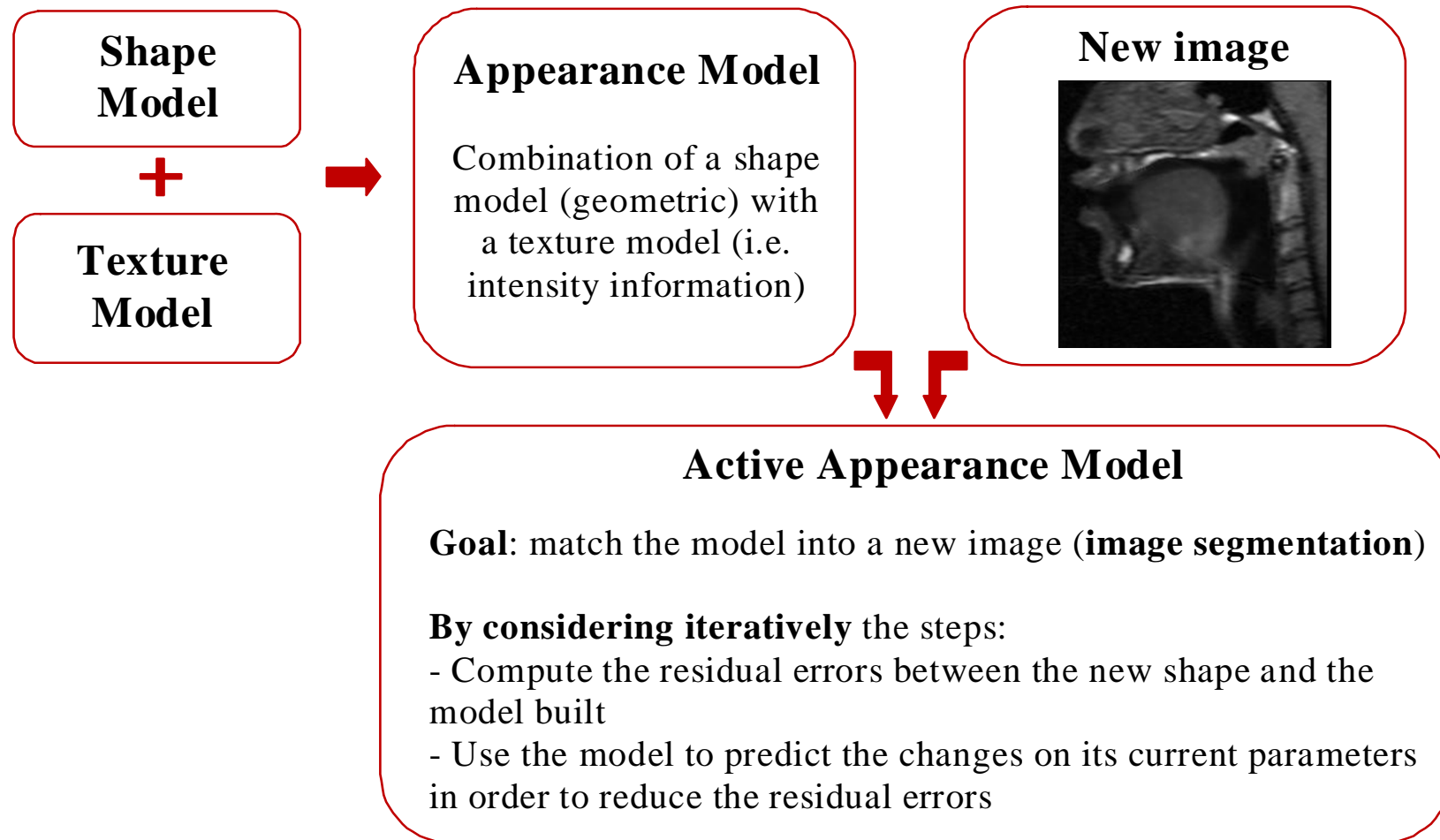
Data and Methods: Active Shape Model (Segmentation process)



Vasconcelos et al. (2008), *Methods to Automatically Built Point Distribution Models for Objects like Hand Palms and Faces Represented in Images*, *Computer Modeling in Engineering & Sciences* 36(3):213-241



Data and Methods: Active Appearance Model (Seg. process)

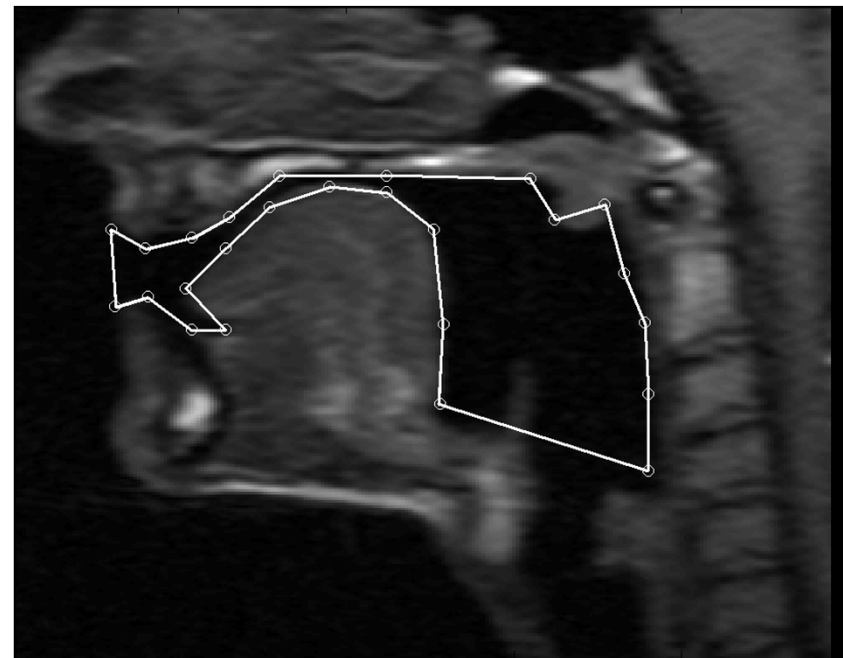


Vasconcelos et al. (2008), *Methods to Automatically Built Point Distribution Models for Objects like Hand Palms and Faces Represented in Images*, *Computer Modeling in Engineering & Sciences* 36(3):213-241



Results: Landmark points

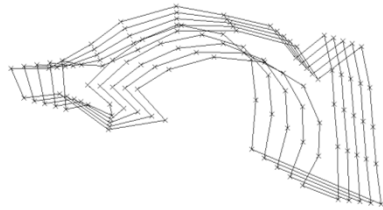
- 25 landmark points were used
 - 4 points at the lips
 - 3 points corresponding to the lingual frenulum and tongue's tip
 - 7 points equally spaced along the surface of the tongue
 - 7 points along the surface of the hard palate, symmetric with tongue points
 - 1 point at the velum
 - 3 points equally spaced at the posterior margin of the oropharynx



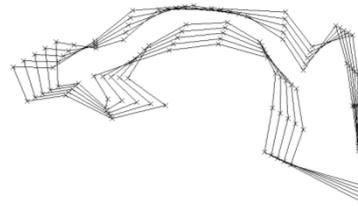
Vasconcelos et al. (2010), Towards the Automatic Study of the Vocal Tract from Magnetic Resonance Images, Journal of Voice, doi:10.1016/j.jvoice.2010.05.002 (in press)



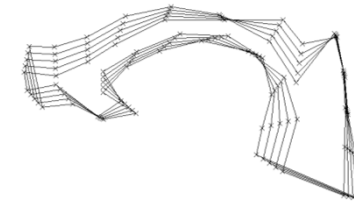
Results: Shape variation modes (-2 σ , - σ , 0, + σ , +2 σ)



1st mode of variation



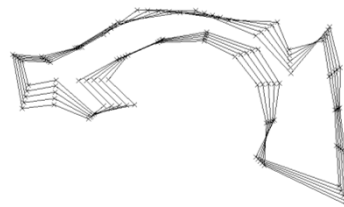
2nd mode of variation



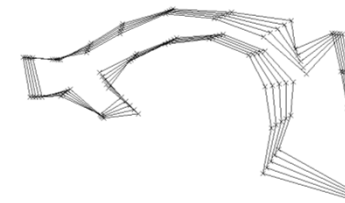
3rd mode of variation



4th mode of variation



5th mode of variation

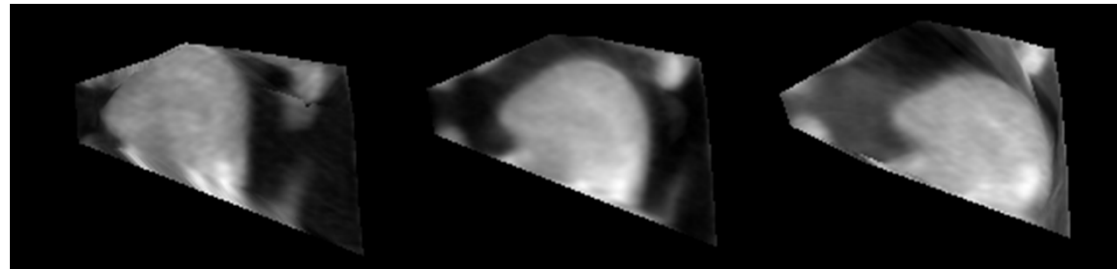


6th mode of variation

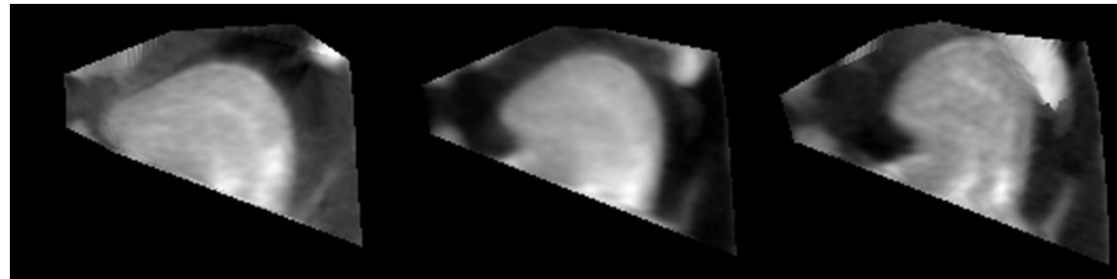
Vasconcelos et al. (2010), Using Statistical Deformable Models to Reconstruct Vocal Tract Shape from Magnetic Resonance Images, Proceedings of the Institution of Mechanical Engineers, Part H: Journal of Engineering in Medicine, doi:110.1243/09544119JEIM767 (in press)



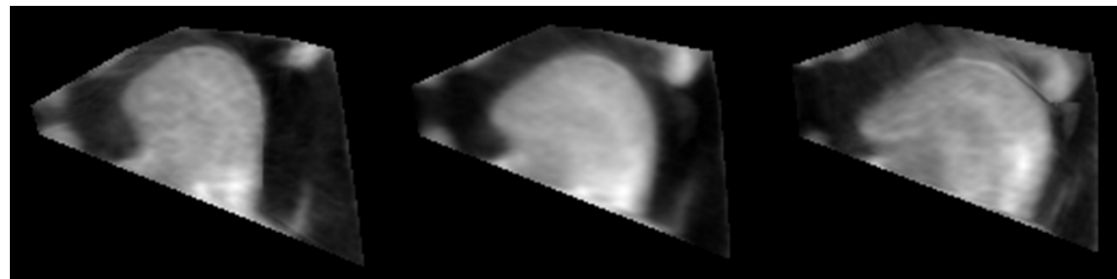
Results: Appearance variation modes ($-\sigma$, 0, $+\sigma$)



1st mode of variation



2nd mode of variation

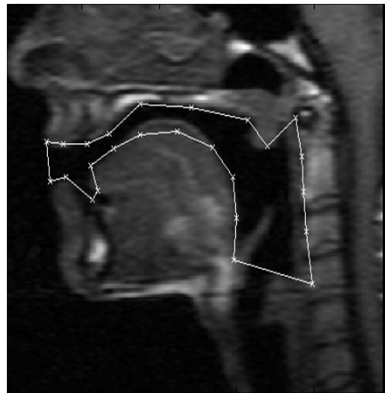


3rd mode of variation

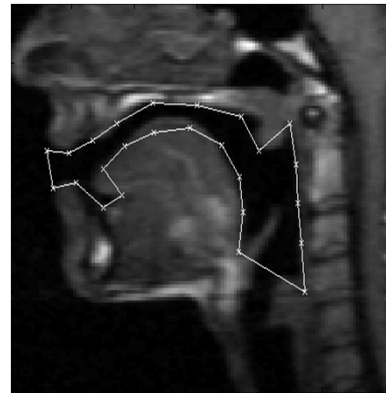


Results: Vocal tract's shape segmentation

- Active Shape Model



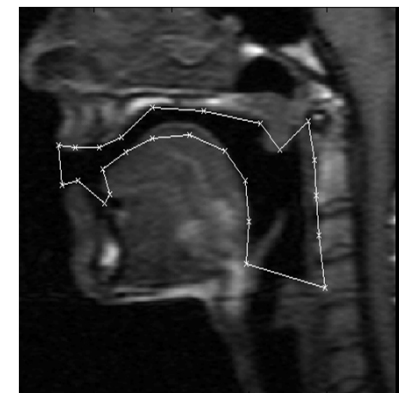
Initial position



4th Iteration

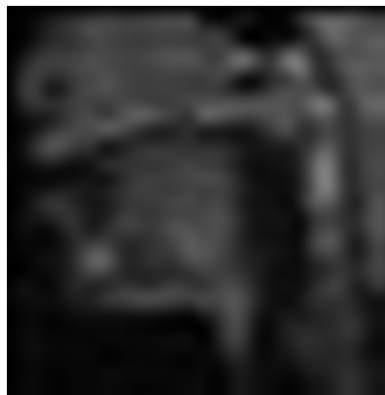


9th Iteration

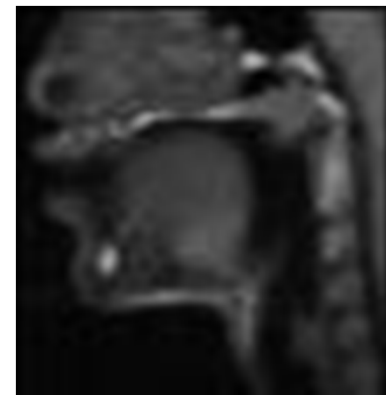


14th Iteration

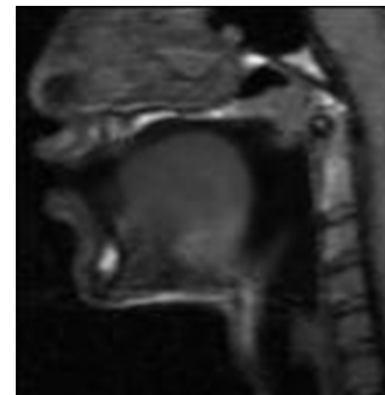
- Active Appearance Model



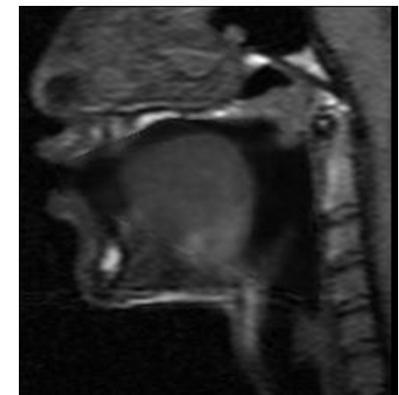
1st Iteration



7th Iteration



12th Iteration



20th Iteration



Results: Vocal tract's shape segmentation

- Errors between automatic/manual segmentations (in pixel)

	Image 1	Image 2	Image 3	Image 4
Active Shape Model	9.99 ± 5.76	9.89 ± 4.43	11.54 ± 6.36	14.23 ± 7.66
Active Appearance Model	4.90 ± 2.42	10.21 ± 5.09	8.98 ± 4.80	9.91 ± 3.95

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Conclusions

- We applied statistical models in MR images to analyze the vocal tract's shape in the articulation of some European Portuguese Sounds and used the models built to segment the vocal tract's shape in new images
- From the results experimental results, we can conclude that the statistical models built can extract the main characteristics of the movements of vocal tract effectively
- Additionally, the models built revealed to be efficient to segment the vocal tract's shape from MR images
- Therefore, the models built can be accurate and efficient tools to be used towards the automatic study of the vocal tract from MR images in, for example, speech simulation or rehabilitation



Acknowledgements

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Thank you!

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