

## RESEARCH ARTICLE

# A texture analysis method for MR images of airway dilator muscles: a feasibility study

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**Objectives:** Airway dilator muscles play an important role in the analysis of breathing-related symptoms, such as obstructive sleep apnoea. Texture analysis (TA) provides a new non-invasive method for analysing airway dilator muscles. In this study, we propose a TA methodology for airway dilator muscles and prove the robustness of this method.

**Methods:** 15 orthognathic surgery patients underwent 3-T MRI. Computerized TA was performed on 20 regions of interest (ROIs) in the patients' airway dilator muscles. 53 texture parameters were calculated for all ROIs. The robustness of the TA method was analysed by altering the locations, sizes and shapes of the ROIs.

**Results:** Our study shows that there is significant difference in TA results as the size or shape of ROI changes. The change of location of the ROI inside the studied muscle does not affect the TA results.

**Conclusions:** The TA method is valid for airway dilator muscles. We propose a methodology in which the number of co-occurrence parameters is reduced by using mean values from four different directions (0°, 45°, 90° and 135°) with pixel spacing of 1 pixel.

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**Keywords:** Computer-assisted image analysis; magnetic resonance imaging; pharyngeal muscles; pterygoid muscles; palatal muscles

## Introduction

Airway dilator muscles play an important role in the analysis of breathing-related symptoms, such as obstructive sleep apnoea. There is insufficient knowledge about the specificity of airway dilator muscles in obstructive sleep apnoea patients. In this article, we propose a texture analysis (TA) methodology for airway

dilator muscles and provide a study of the robustness of the method.

### *Airway dilator muscles*

The pharyngeal airway extends from the nasal choanae to the epiglottis and has no bony structures supporting it except from the posterior pharyngeal wall. The airway can be considered as a collapsible tube, meaning that the airflow is determined by the possible collapsibility of the tube wall, or the patency of the pharyngeal wall.<sup>1</sup> The upper airway may be anatomically small,<sup>2,3</sup> but there are also anatomical factors influencing the volume of the upper airway, such as excess body weight, the amount of fat tissue and craniofacial morphology.<sup>4</sup> The upper airway tends to be sucked closed during inspiration by the negative pharyngeal pressure. The activation

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of the pharyngeal dilator muscles counteracts this. During sleep, an increased pharyngeal resistance takes place in all individuals, most likely owing to diminished activity of the tonically active muscles.<sup>1</sup>

There are several muscles surrounding the pharyngeal airway that dilate and open it. A detailed revision of those muscles has previously been made by several authors.<sup>5-7</sup> Jordan and White<sup>8</sup> have stated that the most important muscles are tensor veli palatini, levator veli palatini, musculus uvulae, palatoglossus and palatopharyngeus (the palatal muscles), genioglossus, the pharyngeal constrictor muscles and the hyoid muscles sternohyoideus, geniohyoideus, thyrohyoideus and mylohyoideus.

The largest upper airway control muscle is the genioglossus. It widens the oropharyngeal airway in the anteroposterior dimension if contracted.<sup>9</sup> During inspiration, the negative pressure may cause pharyngeal collapse, and this is thought to be prevented by contraction of the genioglossus. If the posterior part of the tongue comes in contact with the posterior pharyngeal wall during sleep, it causes obstruction. The genioglossus also plays a role in several other functions, for example, in swallowing.

Pharyngeal constrictor muscles are three separate muscles, the superior, middle and inferior, and their primary function is to promote pharyngeal closure during swallowing. The posterior pharyngeal wall is also stiffened by these muscles.

The position and stiffness of the palate is controlled by the palatal muscles. The tensor veli palatini controls the stiffness of the palate, and the levator veli palatini controls the position of the palate.

The hyoid bone position is influenced by the hyoid muscles. The hyoid bone is moved upward and forward when the geniohyoideus and mylohyoideus are activated. The sternohyoideus and thyrohyoideus move the hyoid bone caudally. Airway dilatation is thought to be the result of simultaneous activation of both muscle groups.<sup>10</sup>

#### *Texture analysis*

TA is a quantitative method to classify textures in medical images. Textures describe the relationship between image grey levels. Textures have characteristics such as brightness, colour, shape and size.<sup>11-13</sup> TA can be performed using three different methods: syntactic, statistical or spectral TA. The statistical TA is the most reported in the medical field, and we applied it as well. The statistical TA examines the spatial distribution of grey values. Statistical texture parameters are extracted from the histogram, the gradient and run-length and co-occurrence matrices.<sup>13</sup>

The muscle has been considered a good candidate for TA in MRI because it is possible to examine fairly large areas of uniform tissue with no partial volume effects.<sup>11</sup> Only a few studies have been published related to the classification of muscles by TA.<sup>14-17</sup> To the best of our knowledge, this is a novel study of a TA method for airway dilator muscles.

Studies by Herlidou *et al*<sup>14</sup> compared TA to normal visual analysis by radiologists for the diagnosis of skeletal muscle dystrophy. According to their studies, the TA method discriminated healthy volunteers and patients with a sensitivity of 70% and a specificity of 86%, and they concluded that TA can provide useful information that contributes to the diagnosis of skeletal muscle disease.

Mahmoud-Ghoneim *et al*<sup>15</sup> introduced a TA method for muscle investigation to discriminate three right-hind limb calf muscle conditions (normal, atrophy and regeneration) in rats. Quantitative TA results were statistically consistent with histology, and therefore the TA method can be considered a potentially interesting, non-destructive method for muscle examination during atrophy and regeneration.

Skoch *et al*<sup>16</sup> evaluated a TA method for the description of MR images of healthy and diseased calf muscles. They also compared the TA method to standard radiological evaluation. As results, they found the classification by TA to be in 80% agreement with the categorization made by the radiological diagnosis, and in some cases, TA was able to describe changes not apparent by visual inspection.

Sikiö *et al*<sup>17</sup> studied the influence of exercise loading on MR image texture of soft tissues in the thighs of athletes. Five thigh muscles were analysed by TA at two anatomical levels of the dominant leg. Significant differences were found, especially between the control and high-impact athlete groups, as well as between the control and odd-impact athlete groups. To conclude, exercise loading was associated with textural variation in the MR images of soft thigh tissues, and TA proved to be a potential method for detecting apparent structural differences in the muscle, fat and bone marrow.

#### *Effect of region of interest size and location*

The selection of the region of interest (ROI) is an important and delicate part of the TA process, especially when considering the clinical implementation of the TA method in radiology. Only a very few studies related to the ROI size, shape and location have been published. Li *et al*<sup>18</sup> performed a computerized analysis on the effect of ROI size and location in studying mammographic parenchymal patterns. Lee *et al*<sup>19</sup> carried out performance testing of several classifiers for differentiating obstructive lung diseases based on TA. To implement the TA method in clinical radiology, it has to be robust, and results have to be independent of intra-observer and interobserver variations. Eventually, the ROI selection has to become an automated or a semi-automated process.

#### *The purpose of our study*

The purpose of our study is to propose a TA methodology for airway dilator muscles and to prove the robustness of this method.

## Methods and Materials

### Patient material

15 patients (11 females and 4 males) with a mean age of 37.2 years (standard deviation, 12.7 years; range, 19–61 years) were included in this study.<sup>20</sup> The subjects of the study were individuals from the study “Effectiveness of orthognathic surgical treatment” made jointly by the University Hospitals of Tampere, Tampere, Finland and University Hospital of Turku, Turku, Finland (supportive statement received from the Ethics Committee of the Hospital District of Southwest Finland and written consent received from all the patients). The subjects were Finnish-speaking adult patients referred for orthognathic surgical treatment to the Oral and Maxillofacial Unit of Tampere University Hospital, Tampere, Finland, during the year 2010.

### MRI protocol

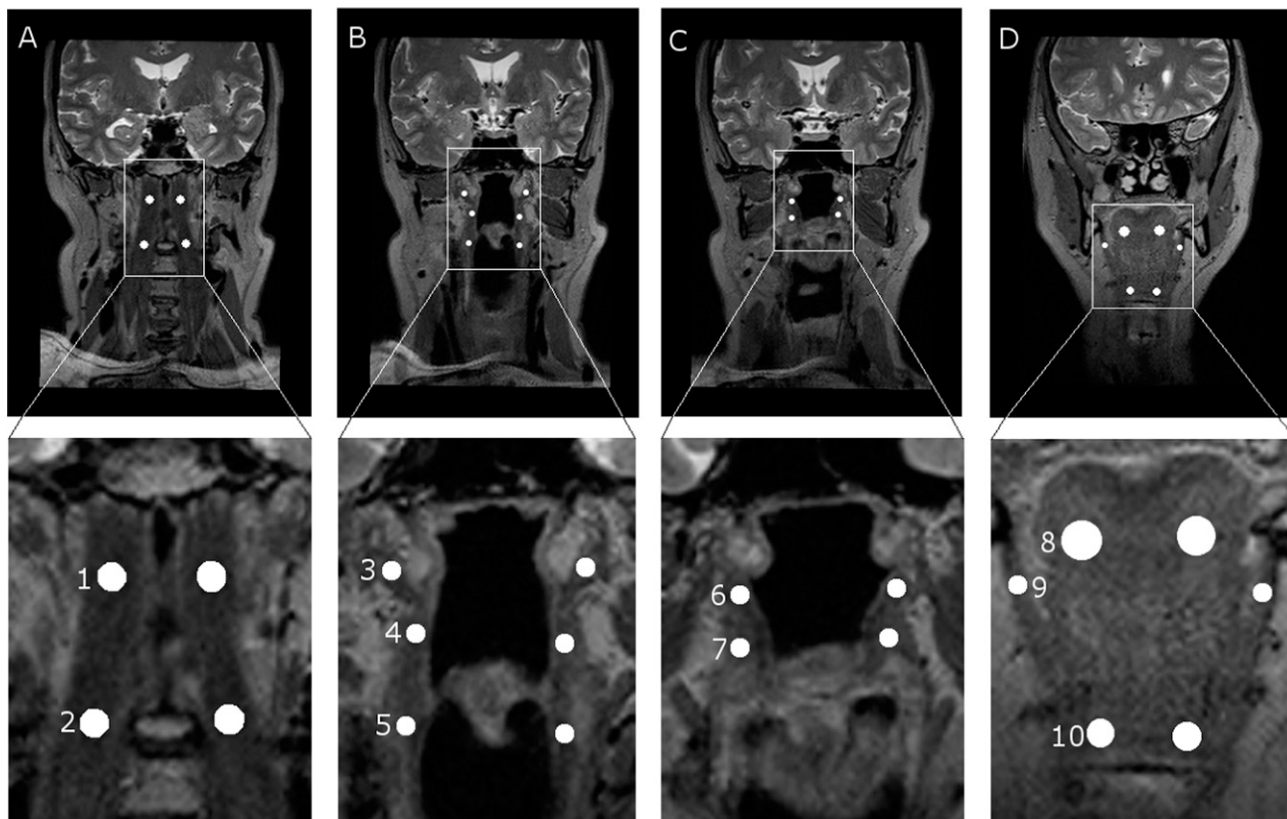
MRI was performed with a 3T Siemens Trio (Siemens Healthcare, Erlangen, Germany). The MRI sequence used in this study was sagittal  $T_2$  weighted 3D-SPACE (sampling perfection with application-optimized contrasts using different flip angle evolution), with an isotropic resolution of 0.9 mm, a repetition time of 3200 ms

and an echo time of 407 ms. The MRI study focused on temporomandibular joints and upper airways.

### Texture analysis

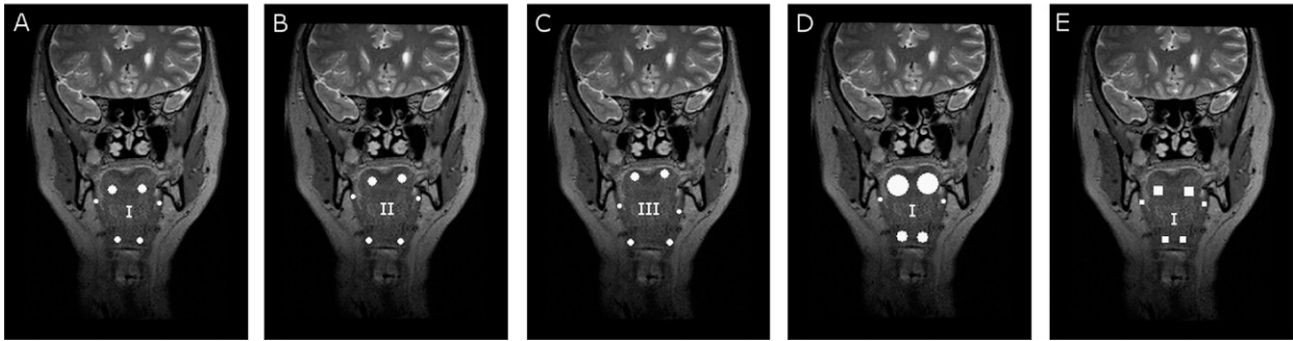
In this study, the following 20 ROIs were located in five airway dilator muscles or muscle groups: four in the longus capitis, six in pharyngeal constrictor muscles, four in palatal muscles, two in the genioglossus, two in the geniohyoid and two in the mylohyoid. All the ROIs are illustrated in Figure 1. These muscles were selected based on the experience of radiologists and on the study by Jordan and White;<sup>8</sup> these muscles can be detected accurately in the MR images of all the patients; and large enough ROIs can be drawn into them. ROIs were paired to locate on the left and right sides of the pharynx. No free-hand ROIs were used in this study, as they are too laborious to draw in clinical use.

Image orientation and slice thickness were individually reconstructed from three-dimensional image information. Image orientation was coronal with minor individual variations, depending on the orientation of the pharynx. The slice thickness was 1 mm for all patients. Image levels and ROI locations were selected by an operator (PK) with the supervision of two experienced radiologists (JJ and PD). The ROI size



**Figure 1** Region of interest (ROI) locations in MR images. The upper row represents the original images, and the lower row represents the magnifications of ROI locations. (a) ROIs in longus capitis: 1, superior; and 2, inferior. (b) ROIs in pharyngeal muscles: 3, superior; 4, middle; and 5, inferior. (c) ROIs in palatal muscles: 6, tensor veli palatini; and 7, levator veli palatini. (d) ROIs in hyoid muscles: 8, genioglossus; 9, mylohyoid; and 10, geniohyoid.





**Figure 2** Illustration of five region of interest (ROI) sets in MR images of hyoid muscles (Figure 1d) to illustrate ROI sets. (a) Circular ROIs and ROI size depending on the muscle. All the patients have ROIs of the same size in the corresponding muscle. ROI location (I). (b and c) Circular ROIs of the same sizes as in (a), but the exact location (II and III) inside the muscles varies. (d) ROI locations the same as in (a) (I), but ROI sizes vary among patients so that the circular ROI is always as large as possible. (e) ROI dimensions and locations (I) the same as in (a), but ROI shape is a square.

The range of variation between different patients and mean values for all the correlation coefficients of different pairs of the ROI sets are presented in Table 3. All the correlation coefficients were >0.95, so we can conclude that all the TA results correlate and significant differences in the TA results of ROIs of different sizes and shapes can be explained by the variation of the ROI area.

### Discussion

In this study, we proposed a methodology for examining airway dilator muscles and proved the robustness of the TA method. In the proposed methodology, the number of co-occurrence parameters is reduced by using mean values from four directions (0°, 45°, 90° and 135°) with pixel spacing of 1 pixel. We studied TA results with different ROI locations, sizes and shapes. The change of location of ROIs inside the studied airway dilator muscles did not result in significant differences in TA results, whereas the change of ROI size or shape resulted in significant differences in TA results. The significant differences were explained by the variation of ROI area and by the means of correlations.

Cobo *et al*<sup>26</sup> evaluated the feasibility and reproducibility of foetal lung TA using automatic ultrasound analysis to assess gestational age. As a result, the association between the weeks of gestation and foetal lung texture presented a Pearson’s correlation of 0.97.

The association was not influenced by the ROI localization or ROI size.

We obtained similar results as Cobo *et al*,<sup>25</sup> as the association was not influenced by ROI localization or ROI size, and the magnitude of the Pearson’s correlation was similar in both studies. In future studies, we could also evaluate the feasibility and reproducibility of the TA method in differentiating patient groups by TA of airway dilator muscles.

Li *et al*<sup>18</sup> performed a computerized analysis on the effect of ROI size and location in studying mammographic parenchymal patterns. Their results showed that there was a statistically significant decrease in performance of the computerized texture features, as the ROI location was varied, but no significant decrease in performance as the ROI size decreased. Lee *et al*<sup>19</sup> carried out performance testing of several classifiers for differentiating obstructive lung diseases based on TA. They studied each ROI location with various ROI sizes. They found that ROI size had a significant effect on the overall accuracy in classification of three different lung diseases and healthy lungs: the overall accuracy increased as the ROI size increased. Li *et al*<sup>18</sup> found that in the case of TA of mammographic parenchymal patterns, the decrease of the ROI size did not decrease the performance of the TA method, whereas Lee *et al*<sup>19</sup> found that in the case of TA for differentiating obstructive lung diseases, the overall accuracy increased as the ROI size increased. These studies suggest that in various anatomical sites, the size, shape and location of

**Table 2** A summary of analysis of variance (ANOVA) results

ANOVA	A vs B	A vs C	B vs C	A vs D	A vs E	B vs D	B vs E	C vs D	C vs E	D vs E
Angular second moment				•••	•••	•••	••	•••	•••	•
Diffusion entropy					•••	••		•••		
Entropy				••	•••	•••	••	•••	••	•
Sum entropy				••	•••	•••	•	•••	••	•

ROI, region of interest.

Statistically significant differences in texture analysis results are presented with dots in table.

•  $p < 0.05$  (found in  $\geq 50\%$  of the ROIs).

••  $p < 0.05$  (found in  $\geq 70\%$  of the ROIs).

•••  $p < 0.05$  (found in  $\geq 90\%$  of the ROIs).

**Table 3** A summary of correlation coefficients

Sets	Range of variation	Average
A vs B	0.96–0.99	0.97
A vs C	0.96–0.99	0.97
A vs D	0.98–1.00	0.99
A vs E	0.97–1.00	0.98
B vs C	0.95–0.98	0.97
B vs D	0.94–0.99	0.97
B vs E	0.95–0.99	0.97
C vs D	0.96–0.99	0.97
C vs E	0.97–0.98	0.96
D vs E	0.98–0.99	0.99

ROIs affect TA results in distinctive ways, as we presumed. In summary, TA protocol in different anatomical sites needs to be validated carefully before the TA process.

In our study of airway dilator muscles, the exact ROI location inside the studied airway dilator muscle did not result in significant differences in TA results. When the sizes or shapes of ROIs studied are different, the results differ significantly. This finding was explained by correlations that result from the change of the ROI area.

The change of ROI size or shape resulted in significant differences in TA results of most of the ROIs studied among the following TA parameters: angular second moment, difference entropy, entropy and sum entropy. Angular second moment is a measure of

homogeneity and gets its largest value when the texture inside the ROI is uniform. Entropy is a measure of complexity and gets its largest value when the ROI is complex.<sup>23,24</sup> Among other parameters, no significant differences were found. In further studies, we can also study results of different parameters and further limit the number of calculated parameters based on the repeatability, variation and information content of those parameters.

The weaknesses of the TA method include the huge amount of texture information needed before statistical analysis and the lack of an efficient clinical TA protocol.

This study is a feasibility study to prove the proposed method to be valid in actual muscle studies of airway dilator muscles. To conclude, the TA method for airway dilator muscles is robust for clinical use. All the TA results correlate, and significant differences in the TA results of ROIs of different size and shape can be explained by the variation of the ROI area. We propose a methodology in which the number of co-occurrence parameters is reduced by using mean values from four directions (0°, 45°, 90° and 135°) with pixel spacing of 1 pixel. We recommend that the size of the ROI be selected before the TA process and that circular ROIs be used with sizes as large as possible in particular ROI locations within all the patients.

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