Computer-assisted evaluation of pulmonary emphysema in CT scans: comparison between a locally developed system and a freeware system*

Avaliação computacional de enfisema pulmonar em TC: comparação entre um sistema desenvolvido localmente e um sistema de uso livre

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Abstract

Objective: To present a locally developed system of computer vision for use with HRCT images, designated SIStema para a Detecção e a Quantificação de Enfisema Pulmonar (SISDEP, System to Detect and Quantify Pulmonary Emphysema), and to compare this system with a freeware system tool. Methods: Thirty-three HRCT images scanned at the apex, hilum and base of the lungs of 11 patients with COPD were analyzed. The SISDEP was compared with the Osiris Medical Imaging Software Program regarding lung parenchyma segmentation, precision of the measurement of the cross-sectional area of the lungs in mm², mean lung density (MLD), relative area (RA) of the lung occupied by voxels with attenuation values < −950 Hounsfield units (RA −950), 15th percentile point (Perc15) and visualization of hyperinflated areas using a color mask. Results: Although both computational systems were efficient in segmenting the lungs, the SISDEP performed this task automatically and more rapidly. There were significant correlations between the two systems in terms of the results obtained for lung cross-sectional area, MLD, RA −950 and Perc15 (r² = 0.99, 0.99, 0.99 and 1.00, respectively). The color mask tool of the SISDEP allowed excellent visualization of hyperinflated areas, discriminating them from normal areas. Conclusions: The SISDEP was efficient in segmenting the lungs and quantifying lung hyperinflation, presenting an excellent correlation with the Osiris system. The SISDEP constitutes a promising computational tool for diagnosing and assessing the progression of emphysema in HRCT images of COPD patients.

Keywords: Pulmonary disease, chronic obstructive; Emphysema; Tomography, X-ray computed; Decision making, computer-assisted.

Resumo

Objetivo: Apresentar um sistema de visão computacional em imagens de TCAR, desenvolvido localmente e denominado SIStema para a Detecção e a quantificação de Enfisema Pulmonar (SISDEP). Comparar esse sistema a um sistema computacional de acesso livre. Métodos: Foram utilizadas 33 imagens de TCAR de 11 pacientes com DPOC com cortes tomográficos em ápice, hilo e base. O SISDEP foi comparado a O Sisnis Medical Imaging Software Program quanto à segmentação do parênquima pulmonar; precisão das medidas da área de secção transversal dos pulmões em mm², densidade pulmonar média (DPM), porcentagem da relative area (RA, área relativa) dos voxels com densidade < −950 Unidades Hounsfield (RA −950), valores de 15º percentil de baixa atenuação (Perc15) e visualização das áreas hiperinfladas por máscara colorida. Resultados: Os dois sistemas realizaram uma segmentação pulmonar eficiente; porém o SISDEP o fez de modo automático e mais rápido. Na comparação das medidas de área de secção dos pulmões, DPM, Perc15 e RA −950, houve alta correlação (r² = 0.99; 0.99; 0.99 e 1.00, respectivamente) entre os dois sistemas. A ferramenta de máscara colorida do SISDEP permitiu excelente visualização das áreas hiperinfladas, discriminado-as das áreas normais. Conclusões: O SISDEP se mostrou eficiente na segmentação dos pulmões e na extração de dados quantitativos da aeração pulmonar com excelente correlação com o sistema Osiris. O SISDEP constitui uma promissora ferramenta computacional para a avaliação diagnóstica e o acompanhamento da evolução do enfisema em imagens de TCAR de pacientes com DPOC.

Descritores: Doença pulmonar obstrutiva crônica; Enfisema; Tomografia computadorizada por raios X; Tomada de decisões assistida por computador.

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Introduction

Worldwide, COPD is a serious public health problem, presenting high rates of morbidity and mortality. In Brazil, there are over 46 million people aged 40 years or older. Of these, over 11 million are smokers, and approximately 10 million have COPD. Pulmonary emphysema is one of the principal components of COPD and is characterized by an abnormal and permanent increase in the alveolar spaces distal to the terminal bronchioles.\(^{(1)}\)

An excellent tool for the diagnosis of the emphysema component in COPD is CT, HRCT in particular.\(^{(2,3)}\) The reading of HRCT images on radiological film or even in electronic media, on a computer screen, is subject to the limitations inherent to intra-rater and inter-rater subjectivity and reliability.\(^{(2)}\) However, the collection of quantitative data regarding the density of the lung parenchyma allows the degree of lung tissue aeration to be precisely determined, presenting an excellent correlation with the degree of emphysema revealed by histopathology.\(^{(4)}\)

Computer-aided diagnosis systems are increasingly being used in various diagnostic modalities. The purpose of such systems is to reduce the time required for reading the test results, as well as to increase the accuracy of the diagnosis, aiding radiologists in interpreting the test results.\(^{(5,6)}\) The concept of computer vision refers to the automation and integration of a wide range of processes and representations used to improve viewing.\(^{(7)}\) Computer vision uses various techniques of digital image processing (DIP) with the purpose of segmenting, recognizing and identifying details of the area of interest in the image, automatically or semi-automatically.\(^{(8)}\) Such techniques can be used to detect and quantify emphysematous areas in the lungs.\(^{(2)}\) A computer vision system for detection and quantification of the pulmonary emphysema component in CT images can provide physicians and patients with another important tool to aid in the diagnosis of the disease and in the evaluation of its progression and response to treatment.\(^{(9)}\)

The availability of CT scans in electronic format, e.g., on compact discs, allows the quantification of emphysema via user-friendly computer programs on personal computers in physician offices or at imaging centers. Such programs are not currently available for routine use by clinicians and radiologists.

We have recently developed a computer vision system, which we have designated the SIStema para a Detecção e a Quantificação de Enfisema Pulmonar (SISDEP, System to Detect and Quantify Pulmonary Emphysema). The SISDEP incorporates tools for use with HRCT images, i.e., tools that can segment the lung parenchyma with precision, allowing the automatic collection of quantitative data regarding lung aeration and the estimation of the degree of emphysema in CT slices.\(^{(10,11)}\)

The objectives of the present study were as follows: to introduce the SISDEP and its tools for evaluation of pulmonary emphysema in HRCT images of patients with COPD; and to compare the SISDEP with a freeware system known as the Osiris Medical Imaging Software (OMIS; Digital Imaging Unit, Geneva, Switzerland) with regard to lung segmentation in HRCT images, data collection for quantitative analysis and visual identification of hyperinflated areas using a color mask.

Methods

We conducted a prospective study for the development of a new computational system. The study was divided into three steps: acquisition of HRCT images of patients with COPD; development of the SISDEP; and comparison between the SISDEP and the OMIS.

The database comprised 33 HRCT images of 11 COPD patients who were clinically stable. Chest X-rays were taken in order to rule out other thoracic diseases; electrocardiography and echocardiography were performed to rule out arrhythmias and heart diseases. Spirometry was also performed, before and after bronchodilator administration, in the morning.

The inclusion criteria were as follows: being over 50 years of age; having been diagnosed with mild, moderate or severe COPD; and being clinically stable. The stability of COPD was characterized by the lack of need for emergency treatment or hospitalization, as well as by unchanged symptoms in the previous two months.

The exclusion criteria were as follows: severe arrhythmias; a history of heart disease or heart disease diagnosed during electrocardiography or echocardiography; systemic arterial hypertension.
(systolic blood pressure ≥ 180 mmHg or diastolic blood pressure ≥ 120 mmHg, or a combination of the two); other active chronic diseases; and other lung diseases.

Of the patients included in the present study, 4 were female and 7 were male. Ages ranged from 59 to 74 years (mean, 65 years). Mean body mass index was 25 ± 4.4 kg/m²; mean FEV₁ was 0.86 ± 0.53 L (33 ± 16% of predicted); mean FVC was 2.29 ± 0.69 L (70 ± 13% of predicted); and mean FEV₁/FVC was 41 ± 13%. One patient had mild COPD, 3 had moderate COPD, and 7 had severe COPD. Severity was determined in accordance with the classification criteria of the Global Initiative for Chronic Obstructive Lung Disease.¹²

The images were obtained using an Aukelet CT scanner (Toshiba TSX-003A, Tokyo, Japan). Before image acquisition, the equipment was calibrated to a density of −1,000 Hounsfield units (HU). Water density calibration was performed in a period not greater than three months before the tests were performed, in accordance with the manufacturer specifications.¹³ For calibration analysis and control, a CT slice of a water phantom of known density was obtained prior to image acquisition.

The images of COPD patients were acquired under the following conditions: collimation of 1.5 mm; field of view of 312 mm; slice intervals of 1.8 s; operation at 120 kV; 200-mA tube filament current; lung window adjustment; center and width of −600 and 1,600 HU, respectively; and image reconstruction with a 512 × 512 pixel matrix. A filter (bone) was applied to the attenuation values between −950 and −500 HU (normally aerated lung), the area (in %) corresponding to voxels with a density lower than −950 HU (emphysematous or hyperinflated lung), the area (in %) that the chosen range occupies in the image. For example, by selecting the color light green (or any other color) for voxels with a density lower than −950 HU (emphysematous or hyperinflated lung) and the color light blue (or any other color) for voxels with a density between −950 and −500 HU (normally aerated lung), the area (in %) corresponding to each range is obtained.¹⁰

The OMIS is used as a research tool for quantitative studies of lung densitometry.¹⁷ The software is widely used in the international scientific community, by physicians and researchers, for studies and analyses of CT images and has various DIP resources. It is a freeware system comprising applications that are more general.¹⁸ The lung parenchyma segmentation available in the OMIS allows users to adjust segmentation manually. The same is true for the measurement of mean, standard deviation, minimum value and maximum value of the attenuation coefficients per unit of area (pixel) and the cross-sectional area of the lungs images, which are presented separately for each lung (when the show data option is selected from
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Figure 1 - Interfaces of the Osiris Medical Imaging Software (in a) and of the SISTema para a Detecção e a quantificação de Enfisema Pulmonar (SISDEP, System to Detect and Quantify Pulmonary Emphysema, in b) for processing HRCT images scanned at the lung bases of a patient with COPD.

Figure 2 - Examples of segmentations classified as concordant between the Osiris Medical Imaging Software (yellow outline) and the SISTema para a Detecção e a quantificação de Enfisema Pulmonar (SISDEP, System to Detect and Quantify Pulmonary Emphysema, red outline). Superimposed segmentation outlines in HRCT images scanned at the apex (in a), hilum (in b) and base of the lungs (in c).

Figure 3 - Examples of segmentations classified as concordant between the Osiris Medical Imaging Software (yellow outline) and the SISTema para a Detecção e a quantificação de Enfisema Pulmonar (SISDEP, System to Detect and Quantify Pulmonary Emphysema, red outline). Superimposed segmentation outlines in HRCT images scanned at the hilum (in a and b) and base of the lungs (in c). In a, concordance is partial, due to the imprecise segmentation performed by the two systems; in b, concordance is partial, due to the imprecise segmentation performed by the SISDEP; and in c, concordance is partial, due to the imprecise segmentation performed by the Osiris Medical Imaging Software.
the tool bar) after segmentation.\(^{(18)}\) In order to calculate MLD, Perc15 and RA \(-950\), the data have to be exported to other programs, such as Excel, for subsequent processing, which takes considerably longer than it does when automatic systems are used. Figure 1 presents the interface of the SISDEP and that of the OMIS.

All images were segmented by the two systems, and the cross-sectional area of the lungs, MLD, RA \(-950\) and Perc15 were subsequently calculated. For the OMIS, the last three items were processed using the Excel software.

The segmentations performed by the two systems were visually compared by two independent raters (a pulmonologist and a radiologist) and were classified as follows: discordant, in cases of gross errors, such as lack of segmentation of more than one third of the lungs or even of an entire lung, or the inclusion of chest wall areas or mediastinal structures, such as the heart and great vessels; partially concordant, when it was possible to superimpose the contours in more than 80% of the outline; and concordant, when it was possible to superimpose the contours in 100% of the outline or when the differences observed were minimal.

In order to determine the accuracy of the segmentation and of the quantitative analysis performed by the SISDEP, the measurements of the cross-sectional area of the lungs, MLD, RA \(-950\) and Perc15 obtained by the system were compared with those obtained by the OMIS and complemented using the Excel program.

For statistical analysis, the calculated variables of lung cross-sectional area, MLD, RA \(-950\) and Perc15 were tested for normal distribution using the Kolmogorov-Smirnov test. Subsequently, Pearson’s correlation test was applied to the data.

Figure 4 - Graphs of dispersion comparing the two systems regarding the 33 images of the 11 patients with COPD. In a, lung cross-sectional area, in mm\(^2\). In b, mean lung density (MLD), in HU. In c, 15th percentile point (Perc15), in Hounsfield units (HU). In d, hyperinflated area (RA \(-950\)), in %. The black line represents the linear regression of the data. SISDEP: SIStema para a Detecção e a quantificação de Enfisema Pulmonar (System to Detect and Quantify Pulmonary Emphysema); and RA: relative area.
applied to the values obtained using the two systems. The variables were paired, and the results were presented as dispersion graphs with the respective correlation coefficients. An α error of 0.05 was adopted as the cut-off point for determining statistical significance. All statistical analyses were performed using the OriginPro software, version 7.5 (OriginLab, Northampton, MA, USA).[19]

Results

The lung segmentations were classified as follows: 17 (51%) were classified as partially concordant; and 16 (49%) were classified as concordant. There were no discordant lung segmentations. Examples of the segmentation of the HRCT images performed automatically by the SISDEP and by the OMIS are shown in Figures 2 and 3. There are two outlines, one yellow, representing the OMIS, and the other red, representing the SISDEP. Examples of concordant segmentation are shown in Figure 2, in which the entire outline of the contour is seen, with a few small differences caused by the imprecise segmentation performed by the OMIS.

Examples of partially concordant segmentation are shown in Figure 3. In Figure 3a, the partial concordance observed was due to the imprecise segmentation performed by the two systems. In Figure 3b, the partial concordance observed was due to the imprecise segmentation performed by the SISDEP, whereas in Figure 3c the partial concordance observed was due to the imprecise segmentation performed by the OMIS.

The dispersion graphs constructed, using the OMIS and the SISDEP, for the measurement of lung cross-sectional area, MLD, RA −950 and Perc15, as well as the correlation coefficient (r²) and the level of significance for each pair of variables, are shown in Figure 4. There was a significant correlation between the measurements obtained by the two systems for the four variables analyzed.

The color mask tool of the SISDEP was programmed to highlight lung tissue according to predefined density ranges: hyperinflated areas ranging from −1,100 to −951 HU (light green). Figure 5 shows the original image (Figure 5a), the segmented image (Figure 5b), and the results obtained using the color mask tool of the SISDEP (Figure 5c). In Figure 5c, the hyperinflated area (with emphysema, highlighted in green) represents 44.2% of the total area, whereas healthy tissue (in gray) represents 46.4%.

Discussion

The present study tested a computer-aided diagnosis system developed in Brazil (the SISDEP) and compared it with the results obtained using a system known worldwide (the OMIS). The ability of the SISDEP to perform automatic segmentation of the lung area and to quantify the total area of emphysema in isolate CT slices was evaluated, based on the attenuation coefficient values provided by the HRCT images. The SISDEP was able to quantify lung hyperinflation, aiding in the evaluation of the extension of emphysema in COPD patients. The present study was the first of its kind developed in Brazil.

The SISDEP was able to perform automatic lung parenchyma segmentation and to measure...
The lung segmentation and hyperinflation quantification performed by the SISDEP correlated with those performed by the OMIS, the former having the advantage of performing those tasks automatically and therefore more rapidly, with no need for complementary analysis using other software. However, the impossibility of manually adjusting the automatic segmentation of the lung outline using the SISDEP constitutes a limitation of the system in cases in which such adjustments are required due to imperfections or segmentation errors.

There is currently no consensus regarding the ideal parameter for quantifying emphysema in HRCT images, and various indices are used. Various authors have used certain indices in isolation: the percentage of hyperinflated areas of density $<-900$ HU; the measurement of MLD and Perc15; and the analysis of lung parenchyma textures. There is currently no gold standard.\(^{(16,21,22)}\) The SISDEP is able to extract various quantitative indices simultaneously, indices that are used to estimate the degree of emphysema, allowing a more detailed analysis of lung aeration.

The lack of a gold standard is due in part to the fact that the radiological densities obtained from CT images are influenced by the width of the slices, the image reconstruction algorithm, the filter used, the calibration and the type of CT scanner used, resulting in the inclusion of artifacts (noise) in the density data of the image. It has recently been reported that the use of thin slices (1- to 2-mm thick) with image reconstruction using standard filters (rather than the edge-preserving smoothing filters used in conventional slices) can minimize such problems.\(^{(23)}\) In addition, the selection of appropriate thresholds for the low densities that represent hyperinflated areas is crucial (from $-1,000$ to $-950$ HU; from $-950$ to $900$ HU; $-930$ HU; or $< -900$ HU), and such thresholds vary greatly among different studies.\(^{(4,9,20,24,25)}\) The lack of consensus regarding the attenuation threshold is due to the lack of standardization of CT parameters.

The present study has certain limitations. The SISDEP was applied to a small number of images, which were acquired using the same CT scanner and following the reconstruction algorithm that is habitually used for high-resolution images. In addition, edge-preserving smoothing filters were used for image acquisition and processing. This type of processing affects the attenuation coefficient, especially at the interface between structures of extremely different densities (such as vessels and air spaces), resulting in more noise and occasionally in overestimation of hyperinflated areas.\(^{(23)}\)

Further studies are needed in order to validate the use of the SISDEP with images obtained using different CT scanners and devices with multiple detectors,\(^{(26)}\) with different slice widths and different reconstruction algorithms, as well as with a greater number of images.

The clinical relevance of the present study lies in the possibility of using the SISDEP to establish an early diagnosis of COPD, to evaluate the progression of COPD, to select the ideal candidate for lung volume reduction surgery and to evaluate the impact of therapeutic interventions on emphysema.\(^{(27,28)}\) Future studies addressing the volumetric quantification (densitometry and volumetric assessment) of hyperinflated lung areas and the evaluation of the patterns of spatial organization of the areas of emphysema (cluster analysis) might broaden the application of the SISDEP in clinical practice, as well as in research.\(^{(29,30)}\)

In conclusion, The SISDEP was efficient in segmenting the lungs and quantifying lung hyperinflation in HRCT images, presenting an excellent correlation with the OMIS. The SISDEP constitutes a promising computational tool that can perform quantitative analyses automatically and semi-automatically for diagnosing and assessing the progression of emphysema in HRCT images of COPD patients more effectively.

**References**


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