Brazilian studies on pulmonary function in COPD patients: what are the gaps?

Agnaldo José Lopes¹,2
Pedro Lopes de Melo³

¹Pulmonary Function Laboratory, State University of Rio de Janeiro,
²Pulmonary Rehabilitation Laboratory, Augusto Motta University Center,
³Biomedical Instrumentation Laboratory, Institute of Biology
and Faculty of Engineering, State University of Rio de Janeiro, Rio de Janeiro, Brazil

Background: COPD is a major cause of death and morbidity worldwide, and is characterized by persistent airflow obstruction. The evaluation of obstruction is critically dependent on sensitive methods for lung-function testing. A wide body of knowledge has been accumulated in recent years showing that these methods have been significantly refined and seems promising for detection of early disease.

Objectives: This review focuses on research on pulmonary function analysis in COPD performed in Brazil during this century.

Materials and methods: The literature was searched using a systematic search strategy limited to English language studies that were carried out in Brazil from the year 2000 onward, with study objectives that included a focus on lung function.

Results: After we applied our inclusion and exclusion criteria, 94 articles addressed our stated objectives. Among the new methods reviewed are the forced-oscillation technique and the nitrogen-washout test, which may provide information on small-airway abnormalities. Studies investigating the respiratory muscles and thoracoabdominal motion are also discussed, as well as studies on automatic clinical decision-support systems and complexity measurements. We also examined important gaps in the present knowledge and suggested future directions for the cited research fields.

Conclusion: There is clear evidence that improvements in lung-function methods allowed us to obtain new pathophysiological information, contributing to improvement in our understanding of COPD. In addition, they may also assist in the diagnosis and prevention of COPD. Further investigations using prospective and longitudinal design may be of interest to elucidate the use of these new methods in the diagnosis and prevention of COPD.

Keywords: COPD, dynamic lung hyperinflation, thoracoabdominal motion, oscillation mechanics, automatic clinical decision-support systems, complexity measurements

Introduction
COPD is a major worldwide public health problem that affects the quality of life of patients and causes physical disability and great socioeconomic impact.¹ Worldwide, 210 million people suffer from COPD,² which has been estimated to be the third-leading cause of death.³ Unlike ischemic heart disease and cerebrovascular disease, which are decreasing in prevalence, deaths from COPD are increasing.³,⁴ Studies and interventions related to COPD diagnosis are necessary for early detection and better disease control. Data from studies published in various regions of the world show that COPD is underdiagnosed.¹

In Brazil, Queiroz et al³ reported 71.4% COPD underdiagnosis in individuals with risk factors who were treated in public primary care facilities, while Santos et al⁷ found that among patients with COPD, 80% had not received a prior diagnosis of the
Pulmonary function tests (PFTs), in addition to being essential tools for the diagnosis and evaluation of the severity of COPD patients, are also of critical importance in a variety of clinical settings, including in prognosis determination and evaluation of the therapeutic response. Spirometry is generally the first functional test performed and is the most important in clinical practice for most patients. However, in recent decades, tremendous technological advancements have been made in the tools used to measure lung function. In addition to the increased technological sophistication of the old functional evaluation methods, new PFTs have been progressively incorporated into clinical practice. All of these developments can have an immediate, positive impact on both early COPD diagnosis and evaluation and the monitoring of the disease. In this regard, many Brazilian researchers have evaluated the use of PFTs on COPD patients using a wide variety of study designs and evaluation techniques.

This paper describes a literature review in which we critically appraise and synthesize the current research on pulmonary function in COPD conducted in Brazil. Based on this analysis, we also discuss gaps in the knowledge that a new study would seek to address.

Materials and methods

The literature was searched using different keywords (Brazil, COPD, emphysema, chronic bronchitis, pulmonary function, spirometry, lung volumes, and respiratory muscles) and database sources (MEDLINE, Scopus, and Web of Science).

Inclusion criteria were research produced by Brazilian researchers, studies in the Brazilian population, studies published since the beginning of this century, and studies reported in English. Exclusion criteria were research where lung function was not included in the study objectives and studies performed outside Brazil.

These processes enabled the researchers to identify 94 appropriate studies for inclusion in the review. The presentation was organized into themes, describing the main areas of research observed in the reviewed literature. A simplified schematic representation of the main themes discussed and the flow of the review is shown in Figure 1.

Results

Pulmonary function based on spirometry to evaluate bronchodilator response

Spirometry is the most often used diagnostic tool in the evaluation of lung function in COPD patients and is an examination with broad applicability and reproducibility in most patients. In a compatible clinical situation, spirometry is needed for COPD diagnosis and is characterized by persistent obstruction based on a forced expiratory volume in 1 second (FEV₁):forced vital capacity (FVC) ratio of <70% after bronchodilator use. In a Brazilian study, however, Lundgren et al investigated the use of the FEV₁:FVC ratio as an alternative to the FEV₁:FVC ratio in
screening for COPD. This analysis may be more comfortable for patients and permit the use of simpler interpretation algorithms. The diagnostic criterion of airway obstruction (defined as an FEV\(_1:FVC\) ratio <70%) showed sensitivity (Se) of 92% and specificity (Sp) of 99%. The positive predictive value was 100%, and the negative predictive value was 98%. The Kendall correlation calculation resulted in a correlation coefficient of 0.99 (P<0.0001). The authors concluded that evaluation of the FEV\(_1:FVC\) ratio is accurate in screening for COPD.\(^{11}\) Another (more recent) study involving Brazilian researchers sought to determine the factors associated with a change in the interpretation of spirometry for COPD diagnosis. These authors followed a cohort over a period ranging between 5 and 9 years after initial examination using different criteria to diagnose COPD. In that study, the rate of inconsistent mild COPD diagnosis was 11.7% using an FEV\(_1:FVC\) ratio <70%, 5.9% using an FEV\(_1:FVC\) ratio below the lower limit of normal (LLN) and 4.1% using Global Initiative for Chronic Obstructive Lung Disease (GOLD) stages II–IV criteria. The most important factor associated with diagnosis inconsistency was the closeness of the FEV\(_1:FVC\) or FEV\(_1:FEV\)\(_6\) ratio to the LLN during the first examination. The authors concluded that using an FEV\(_1:FEV\)\(_6\) ratio < LLN or GOLD stages II–IV as airflow-obstruction criteria reduced inconsistencies in the diagnosis of mild COPD.\(^{12}\) In addition, using the GOLD classification, Moreira et al determined which of the two GOLD ratings (BCD or II–IV) better reflected the functionality of patients with moderate-to-very severe COPD using 6-minute walking distance (6MWD), activities of daily living (ADLs), and the variables activity/inactivity of daily living evaluated by monitoring activity. These researchers observed that despite the low correlation coefficients, both GOLD ratings showed better association with 6MWD than ADLs evaluated subjectively or objectively.\(^{13}\) In another Brazilian study, Menezes et al showed that the diagnosis of COPD was itself associated with overall mortality (hazard ratio 1.43 for FEV\(_1:FVC\) < LLN, 2.01 for GOLD stages II–IV, 1.46 for GOLD stages I–IV, and 1.5 for FEV\(_1:FEV\)\(_6\) < LLN).\(^{14}\)

The diagnostic and therapeutic approach in COPD patients should take into account the reversibility of airway obstruction determined by a pharmacodynamic test. Tavares et al investigated bronchoconstriction reversibility associated with the use of 400 μg of fenoterol in a sample of 64 patients. The authors evaluated the frequency of responses presented in FVC, slow VC, inspiratory capacity (IC), residual volume (RV), airway resistance (R\(_{aw}\)), and specific airway conductance. Several parameters showed clear changes due to bronchodilator use in COPD. The clinical impression reported was that patients may experience alleviation of dyspnea and present clinical progress even without an FEV\(_1\) response.\(^{15}\)

Usually, the severity of COPD is classified by FEV\(_1\), after bronchodilator use, and improvement in FEV\(_1\), and decrease in its rate of decline are the most generally used outcomes in clinical research directed at evaluating treatment response and preventing disease progression.\(^1\) However, the most important outcomes for COPD patients are symptoms and quality of life, and the correlation between FEV\(_1\) and the degree of dyspnea, health status, exercise tolerance, and frequency of exacerbation appears to be poor, which has also been demonstrated by some Brazilian studies.\(^{16–18}\) Pereira et al found a weak association of FEV\(_1\) with both total score on the St George’s Respiratory Questionnaire and the activity domain score (r=-0.32, P=0.04, and r=-0.34, P=0.03, respectively).\(^{18}\) Several Brazilian researchers have shown that use of the BODE (body mass index, airway obstruction, dyspnea, and exercise capacity) index, rather than exclusively FEV\(_1\), seems to improve the association with quality-of-life markers.\(^{19–21}\) Camargo and Pereira observed that among spirometric variables, only the IC was selected by the multivariate model for 6MWD, with a 32% coefficient of determination.\(^{22}\) Corroborating this finding, another study showed that the IC obtained after bronchodilator use was the better functional predictor of 6MWD and significantly related with GOLD score and BODE index.\(^{23}\) Interestingly, these authors proposed a cutoff IC value after bronchodilation of 70% of that predicted for the Brazilian population as a method to classify COPD patients, as static lung-volume measurement is not always available. Santos et al observed that 59% of the variation in 6MWD could be explained by postbronchodilator IC, prolonged use of home oxygen therapy, and number of medications used in the handling of COPD.\(^7\) Another study explored the association between energy expenditure and lung function in COPD patients undergoing indirect calorimetry measures while performing five ADLs. In this study, maximal voluntary ventilation was the only lung-function parameter associated with energy expenditure. Therefore, the authors emphasized the limited extent to which FEV\(_1\) is related to the functional performance of COPD patients.\(^{24}\) Interestingly, Mendes et al investigated the influence of the FVC maneuver on the cardiovascular system in COPD patients. They observed that at the beginning of spirometry, the heart rate (HR) decreased (P<0.001) and then gradually increased until the end of the test (P<0.001).
After the end of the maneuver, the HR continued to increase to a peak \( (P<0.001) \), and then fell rapidly to a value below resting values \( (P<0.001) \) before returning to baseline. In that study, blood pressure and HR variability (HRV) did not change during the FVC maneuver.\(^{25}\)

**Pulmonary function tests in analysis of lung volume and dynamic lung hyperinflation**

The measurement of lung volume can provide important information for evaluating the lung function of COPD patients, as it reflects the mechanical behavior of the lung and its elastic properties. In one study conducted in Brazil, Coertjens et al evaluated total lung capacity (TLC) and RV values obtained by the single-breath helium-dilution (SBHD) method and whole-body plethysmography (WBP) in patients with COPD. The study showed that the TLC and RV values were higher in the WBP than the SBHD method, and the difference was related to airway obstruction. The authors described linear equations that allowed adjustment of the TLC and RV values for airflow to predict the lung volume as measured by WBP. This correction can increase the accuracy of the SBHD method for assessing lung volume, and may contribute to the expansion of the use of the SBHD method, which is relatively simple, faster, and more widely available.\(^{26}\)

Albuquerque et al showed that the IC:TLC ratio was functionally more representative than traditional airflow limitation and lung-hyperinflation indices in COPD patients, and was a strong predictor of marked reduction in maximum oxygen consumption. These authors found that IC:TLC values of \( \approx 28\% \) were associated with reduced exercise tolerance, and that increased values were observed in patients with lower loss of functional exercise capacity.\(^{27}\) Interestingly, the IC:TLC ratio also is an independent predictor of mortality in COPD patients.\(^{28}\) Mazzuco et al evaluated 16 sedentary males with COPD to assess the effect of lung function on HRV levels. They observed that HRV-index responses were more prominent during a respiratory sinus arrhythmia maneuver in moderate-to-severe COPD patients, and a worse HR dynamic was related to a greater decline in lung function. Moreover, these authors observed a strong correlation between the diffusing capacity for carbon monoxide and the RR interval during parasympathetic stimulation in these patients \( (r=0.77, P<0.05) \).\(^{29}\)

Lung dynamic hyperinflation (DH) is a contributing factor to reduced physical capacity and a pulmonary adaptation to hyperpnea and the high metabolic requirement that occurs during exercise. In this regard, Castro et al investigated DH resulting from ADLs in COPD patients. They observed a reduction in IC after ADLs compared to IC values measured at rest \( (P=0.04) \) and a significant correlation between the degree of dyspnea and variation in IC between resting and ADLs \( (r=0.85) \).\(^{30}\) Similarly, Silva et al found that patients with moderate-to-severe COPD developed DH after performing common ADLs involving the upper and lower limbs. These researchers observed a significant reduction in IC after all six tested activities, including walking on a treadmill, storing pots, walking 56 m carrying a 5 kg weight, climbing stairs, simulating taking a shower, and putting on shoes.\(^{31}\) Similarly, Cardoni et al studied patients with moderate-to-severe COPD using serial IC measurements during cardiopulmonary exercise testing with a treadmill at a constant speed, and found a DH frequency of 63.3%. The authors also observed greater impairment of resting lung function in patients with DH than in those without DH.\(^{32}\) In another Brazilian study, a randomized work including 30 COPD volunteers without severe hypoxemia, Scuarcialupi et al found that improvement in resting IC after bronchodilator use was associated with increased tolerance to effort, even in patients with COPD without DH. However, patients who showed no increase in resting IC were still able to obtain a functional benefit from bronchodilator use, provided they presented with DH during exercise.\(^{33}\)

Lung DH caused by expiratory flow limitation during a reduced expiratory time markedly increases the end-expiratory lung volume (functional residual capacity) in many COPD patients. In this regard, Lopes et al investigated the immediate effect of the application of continuous positive airway pressure (PAP) on hyperinflation and \( R_{aw} \) in severe stable COPD patients. They observed that continuous PAP reduced lung volume and \( R_{aw} \) for 15 minutes, but lung volume returned to baseline values within 30 minutes.\(^{34}\) Monteiro et al evaluated the effects of expiratory PAP on operating lung volume during exercise in COPD patients. These authors observed that the application of expiratory PAP reduced DH, as demonstrated by lower operating lung volume after submaximal exercise in patients with COPD who had previously exhibited DH during exercise.\(^{35}\)

**Pulmonary function analysis of small airways and ventilation distribution**

Although first described approximately 60 years ago, an increasing interest in recent years has been developed in the use of the nitrogen-washout test (NWT). The NWT is increasingly incorporated in day-to-day pulmonology practice, as it can detect heterogeneity in the distribution of ventilation and small-airway disease when other PFTs still present normal
values. In addition to its importance in the pathophysiological understanding of various clinical conditions, the evolution of its technical apparatus justifies the use of the NWT. The NWT can facilitate the search for COPD patients whose phenotype consists of an abnormality of the small airways, and this knowledge can be used to facilitate the development of new drug therapies geared specifically toward the small airways. In Brazil, Lopes and Mafort conducted a cross-sectional study evaluating the relationship between the parameters obtained through the nitrogen single-breath washout ($N_{2}$SBW) test and 6MWD, degree of dyspnea, and quality of life in COPD patients. These authors found a strong correlation between 6MWD and the phase III slope of the $N_{2}$SBW ($r=0.796$, $P=0.0001$) and between 6MWD and RV ($r=0.651$, $P=0.0001$). Using multivariate analysis, the authors demonstrated that the $N_{2}$SBW Phase III slope was the only independent predictor of 6MWD ($R^{2}=0.703$, $P=0.0001$), COPD Assessment Test ($R^{2}=0.586; P=0.0001$), and the modified Medical Research Council Scale score (relative risk 1.14, $P=0.0001$).

Heterogeneity of ventilation and small-airway disease can also be identified by an increase in the alveolar plateau slope of the exhalation curve of gases, such as $CO_{2}$, measured during tidal volume breathing using volumetric capnography. Using this tool, Veronez et al measured the normalized Phase III slopes in patients with non cystic fibrosis bronchiectasis and in COPD patients to compare the slopes obtained in both groups. They observed that while COPD patients had worse spirometry and 6MWD values, the mean capnographic variables Phase II slope, Phase III slope normalized by mean EV, and Phase III slope normalized by end-tidal $CO_{2}$ concentration were similar. The authors concluded that gas-elimination curves were not sufficiently sensitive to monitor the severity of structural abnormalities, although the normalized Phase III slope needed to be studied further as a sensitive index for detecting small-airway diseases in COPD patients. In another study conducted in Brazil, Masiero et al evaluated perfused lung fraction in COPD patients using single-photon emission computed tomography. They observed that the lung-volume fraction that receives blood from the pulmonary artery was reduced in these patients and that the degree of underperfusion correlated with the FEV$_1$/FVC value ($r=0.597; P<0.001$).

Pulmonary function in evaluation of respiratory muscles and chest wall

Respiratory muscle weakness may be related to both an increased respiratory system workload and a reduction or interruption in neural stimulation. Reduced function of the respiratory muscles represents increased physical and functional limitations, as it can cause health conditions that limit normal ADLs. In females with COPD, Mangueira et al found that both maximal inspiratory pressure (MIP) and maximal expiratory pressure were below the normal values for the Brazilian population ($P=0.0001$). Interestingly, these authors also showed that health-related quality of life had a negative linear correlation with MIP ($r=-0.34$, $P=0.034$). The reduced MIP in these females reflects excessive inspiratory effort caused by an abnormally high lung volume, while the reduced maximal expiratory pressure results in changes in expiratory muscle length and loss of exhalation strength. Another Brazilian study in this area showed that overweight or obese severe COPD patients had increased inspiratory muscle strength compared to patients with the same degree of airflow obstruction but who were of normal weight or were underweight. The authors concluded that excess weight or obesity can counteract the disadvantages of being overweight and lead to a better prognosis in COPD patients. Reis et al observed that the sympathetic–vagal balance is damaged at rest, and additionally that cardiac autonomic HR control is associated with respiratory muscle weakness. In another Brazilian study, Donária et al evaluated the relationship between sniff nasal inspiratory pressure and COPD severity. They found that sniff nasal inspiratory pressure had a significant correlation ($r=-0.62$, $P<0.001$) with COPD severity, as evaluated by the BODE index, and that the cutoff point of 63 cmH$_2$O showed a better combination of Se and Sp for predicting worse scores on the BODE index for these patients.

In recent years, interest has increased in the use of ultrasonography (US) to evaluate the diaphragm because it is a noninvasive, radiation-free method that can be repeated often over a short time. Yamaguti et al prospectively evaluated the diaphragmatic mobility of 42 COPD patients over 48 months using US, classifying them as patients with low mobility ($\leq 33.99$ mm) or high mobility ($\geq 34$ mm). These researchers observed that the group of COPD patients with low diaphragmatic mobility had higher BODE index scores and at the end of the 4-year period had a higher mortality rate than the group of patients with high mobility (15.8%, $P=0.02$). In addition, Paulin et al used US to evaluate the effect of diaphragmatic mobility on exercise tolerance and the degree of dyspnea in COPD patients. They found a significant correlation between diaphragmatic mobility and 6MWD ($r=0.38$, $P=0.005$) and the degree of dyspnea ($r=-0.36$, $P=0.007$).
Pulmonary function based on evaluation of thoracoabdominal motion and breathing pattern

Most of the abnormalities suggest dysfunction of respiratory muscles, particularly paradoxical motion of the diaphragm. In this context, optoelectronic plethysmography (OEP) is a noninvasive tool for indirect measurement of pulmonary ventilation that can evaluate in a three-dimensional, real-time manner breath-to-breath changes in total chest-wall volume and its various compartments, including the pulmonary rib cage, abdominal rib cage, and abdomen. Using OEP, Borges-Santos et al analyzed the thoracoabdominal kinematics of 54 COPD patients at rest and during exercise. They found that anxiety and depression affected the sensation of dyspnea and the clinical management of the disease, although these symptoms did not have any effect on thoracoabdominal mobility or breathing pattern in COPD patients.

Another Brazilian study used OEP to show increased tidal volume in a sitting position without back support compared to a sitting position with back support in COPD patients (P=0.01). These authors also observed an increase in abdominal contribution to tidal volume in the supine position compared to the sitting position without back support (P<0.01) and the sitting position with back support (P<0.001).

In order to allow remote evaluation of abnormalities in thoracoabdominal motion (TM), Junior et al developed a telemedicine system for Internet-based home monitoring of TM. Results in patients with COPD showed that the acquisition and analysis of TM motion signals can be accurately performed. The user can also receive medical recommendations, and thus the proposed system may help in a wide range of telemedicine scenarios, including follow-ups and rehabilitation programs. This method may contribute to reducing costs and improving assistance offered to patients with COPD.

Breathing-pattern and TM abnormalities may contribute to exercise limitation in COPD. Alves et al investigated these changes during exercise in 22 males with stable COPD. The asynchrony was analyzed at rest and during three levels of exercise (30%–50%, 70%–80%, and 100% maximal workload). It was observed that asynchrony increased with exercise level (phase angle 11.95°±7.24° at rest vs 22.2°±15° [P=0.002], 22.6°±4° [P<0.001], and 22.7°±8° [P<0.001], respectively). The authors concluded that the increase in ventilation during exercise in COPD patients was associated with the major motion of the abdominal compartment and with an increase in asynchrony independent of exercise intensity.

Diaphragmatic breathing (DB) is largely applied in pulmonary rehabilitation of patients with COPD; however, it has been little studied. Yamaguti et al investigated the influence of a DB training program (DBTP) on TM and functional capacity in patients with COPD. Thirty subjects (FEV₁ 42%±13% predicted) were randomly allocated to either a training group (TG) or a control group (CG). The subjects in the TG performed a 4-week supervised DBTP (three individualized weekly sessions), while those in the CG received their usual care. The 4-week DBTP resulted in greater abdominal motion in the TG group during natural breathing when compared with the CG (F=8.66, P<0.001), as well as increased abdominal motion during voluntary DB (F=4.11, P<0.05) and greater diaphragmatic mobility (F=15.08, P<0.001). An improvement in 6MWD and health-related quality of life was also observed in the TG (F=4.9, P<0.05). It was concluded that DBTP induced increased diaphragm participation during natural breathing, resulting in an improvement in functional capacity of patients with COPD.

Fernandes et al studied the efficacy of DB in 29 patients with moderate and severe COPD. The protocol started with 4 minutes of tidal breathing, followed by 2 minutes of DB and 4 minutes of natural breathing. The authors observed that five moderate and five severe patients with COPD performed DB with asynchronous TM, which resulted in the worsening of the dyspnea. Effective DB was related to increased diaphragmatic mobility and inspiratory muscular strength, lower scores for dyspnea and hypoxemia, and coordinated TM. This provides evidence that DB can improve breathing pattern and ventilatory efficiency without causing dyspnea in patients whose respiratory muscular system is preserved.

Cancelliero-Gaiad et al compared the respiratory pattern during natural breathing, DB, and Pilates breathing methods in 15 COPD patients and 15 healthy subjects. DB increased respiratory volumes, times, and SpO₂ and reduced respiratory rate in the two studied groups. Pilates breathing resulted in an increase in respiratory volumes in healthy group. No additional improvements in respiratory pattern were observed in the COPD patients. The two groups showed increased thoracoabdominal asynchrony under DB, with a greatest increment in the group composed by healthy volunteers.

Fernandes et al evaluated breathing pattern, TM, and ventilation in controls and patients with moderate and severe COPD. The volunteers were studied in a semirecumbent position at rest. COPD patients showed increased dead-space ventilation and lower diaphragmatic motion, which are associated with impairment of ventilatory function and changes in breathing patterns. This is initially seen as rapid...
and shallow breathing with no changes in TM. These findings were more pronounced in severe COPD, but still without changes in TM.\textsuperscript{54}

**Pulmonary function tests based on oscillation mechanics**

The forced-oscillation technique (FOT) characterizes respiratory impedance and its two components: respiratory system resistance and reactance. The method requires only passive cooperation and no forced expiratory maneuvers. Another important advantage, particularly in pathophysiological research, is that the FOT can be used to provide information on the mechanical characteristics of the respiratory system that is complementary to the information provided by spirometry.\textsuperscript{55} At the beginning of this century, Melo et al\textsuperscript{56} reviewed the literature, describing several applications and the high potential of clinical use of this method. As an example, Figure 2 shows typical results obtained in controls and patients with COPD classified according to GOLD.\textsuperscript{57}

The FOT was subsequently used in a series of studies concerning COPD. In these studies, the following parameters were used in the interpretation of the resistance curves: resistance at the intercept ($R_0$), associated with the total resistance of the respiratory system; mean resistance ($R_m$), related to the airway caliber; and the slope of resistance ($S$), which is associated with the homogeneity of the resistive properties of the respiratory system. The results presented in the reactance curves were interpreted using mean reactance ($X_m$), which is associated with the homogeneity of the reactive properties of the respiratory system, and dynamic compliance ($C_{dyn}$).

The absolute value of respiratory impedance ($Z_{4Hz}$), which is related to the work performed by the respiratory muscles to overcome resistive and elastic loads, promoting the movement of air in the respiratory system, was also evaluated.

**Contribution in pathophysiological studies and evaluation of diagnostic capacity**

Di Mango et al\textsuperscript{58} evaluated the diagnostic potential of the FOT in detecting changes in the respiratory mechanics in patients with COPD, comparing healthy subjects ($n=21$) with groups of patients with COPD (mild airway obstruction, $n=16$; moderate, $n=23$; and severe, $n=40$). Similar to the behavior observed in Figure 2A, COPD resistance was higher than observed for healthy volunteers. Increasing COPD severity resulted in an increase in total respiratory resistance, especially at lower frequencies, which introduced a frequency dependence of the resistance. Also similar to the example in Figure 2B, respiratory system reactance became more negative with obstruction. The highest changes were observed in the lower frequencies. All of the parameters used to describe resistance changes showed highly significant changes with the degree of airway obstruction ($P<0.0001$).

Considering specifically the comparisons between controls and patients with mild obstruction, $R_0$ and $R_m$ increased significantly, while $S$ did not present significant changes. Similarly to resistive parameters, all reactive parameters showed significant changes with airway obstruction ($P<0.006$). It is interesting to observe that in the initial condition of obstruction, resistance parameters and curves showed higher changes than reactance. On the other hand, in the later stages, the

---

*Figure 2* Examples of results for the resistance ($R_{rs}$; **A**) and reactance ($X_{rs}$; **B**) obtained in normal subjects and patients with COPD classified according to the GOLD criteria. **Abbreviation:** GOLD, Global Initiative for Chronic Obstructive Lung Disease.
reactive parameters and curves were the most sensitive. These changes clearly describe the mixed pattern usually presented in the more advanced stages of COPD.

Aiming to contribute to preventing COPD development, Faria et al\(^5\) investigated if the FOT would be able to identify the initial abnormal mechanical changes associated with the smoking habit. The study included FOT and spirometry measurements in groups of nonsmokers (n=28) and smokers (n=28). While the spirometric parameters were still at normal levels, showing small, nonsignificant reductions, the FOT parameters presented higher changes. It was observed that \(R_0\), resonance frequency, and \(Z_{4Hz}\) presented significant increases. Significantly more negative values in \(X_m\) and more reduced \(C_{dyn}\) values were also observed. The analysis of the area under the receiver-operating characteristic (ROC) curve (AUC)\(^6\) showed that \(R_0\), \(C_{dyn}\), and \(Z_{4Hz}\) presented diagnostic accuracies equal to or greater than 75\%, providing evidence that these parameters can be useful in the clinical diagnosis of early abnormalities due to the smoking habit. In addition, the comparison of the AUCs obtained among oscillometric and spirometric parameters revealed significantly higher accuracies for FOT parameters, as described in Figure 3.

These findings provide evidence of two important points: 1) the FOT may be more sensitive than spirometry in the identification of the precocious abnormalities associated with smoking and 2) this method may help in screening smokers who may develop COPD. Further studies are necessary to investigate these two hypotheses in a wider number of subjects. If they are confirmed, FOT pulmonary function analysis may help in detecting initial changes during a stage at which pathological abnormalities are still potentially reversible. This may contribute significantly to preclusion of the development of COPD.

In the next step of this research, Faria et al\(^6\) performed a comparative analysis of the diagnostic accuracy of the FOT and spirometric parameters in volunteers presenting different number of pack-years smoked: a control group and smokers classified as \(<20\), \(20–39\), \(40–59\), and \(>60\) pack-years.

**Figure 3** Differences in the diagnostic performance of FOT and spirometric parameters, calculated by the difference between AUCs.

**Notes:** Note the higher AUC values in the FOT parameters. The significance is shown at the top of the bars: \(S, P<0.05\); \(1, P<0.01\). Adapted from Faria et al\(^5\) under creative commons license: [http://creativecommons.org/licenses/by/2.0/](http://creativecommons.org/licenses/by/2.0/).

**Abbreviations:** FOT, forced-oscillation technique; AUCs, areas under the curve; \(Z_{4Hz}\) absolute value of respiratory impedance; \(C_{dyn}\) dynamic compliance; \(X_m\) mean reactance; \(R_m\) mean resistance; \(R_0\) resistance at the intercept; FEF, forced expiratory flow; FVC, forced vital capacity; \(FEV_1\) forced expiratory volume in 1 second; \(S\), slope of resistance; \(Fr\), resonance frequency.
The precocious abnormal changes due to smoking were adequately identified in the volunteers presenting <20 pack-years by the FOT. The ROC analysis showed significantly higher accuracy for the FOT ($P<0.01$). Comparisons in groups with higher tobacco consumption ($20–39$, $40–59$, and $>60$ pack-years) revealed similar diagnostic accuracies for the FOT and spirometry. This work provided additional evidence that the FOT may help in the diagnosis of precocious smoking-related respiratory abnormalities (<20 pack-years). In addition, there is also evidence that the FOT has similar accuracy to spirometry in the diagnostic of more advanced abnormalities ($20–39$, $40–59$, and $>60$ pack-years).

In recent work from our group, Silva et al$^{62,63}$ evaluated the diagnostic accuracy of monofrequency oscillometric pulmonary function in smokers and patients with COPD. These studies evaluated mean within-breath respiratory impedance ($Z_b$) during inspiration ($Z_i$), and respiratory cycle dependence ($ΔZ_{rs}$) at the beginning of inspiration ($Z_{ls}$) and expiration ($Z_{le}$), as well as peak-to-peak impedance ($Z_{pp}$), were also analyzed. In general, the within-breath $Z_b$ parameters presented significant moderate-to-good correlations with spirometric indices of airway obstruction. In contrast to the control subjects and the smokers, the patients with COPD presented significant inspiratory–expiratory differences (Figure 4).

The adverse effects of moderate airway obstruction were adequately identified by the $Z_{pp}$ (AUC = 0.83). In addition, mean impedance, $Z_i$, $Z_e$, $Z_{ls}$, $Z_{le}$, and $ΔZ_{rs}$ identified mechanical abnormalities in severe and very severe patients with high accuracy (AUC > 0.9). These results indicate that COPD induces respiratory cycle dependence, which is proportional to the degree of airflow obstruction. Another important finding of these studies$^{62,63}$ is that the $Z_{le}$ observed in different phases of the respiratory cycle may be useful in the detection of COPD.

**Oscillatory pulmonary function tests in bronchial hyperresponsiveness**

The additional information provided by the FOT may help improve our understanding of the changes in respiratory mechanics that occur after the application of a bronchodilator. Based on this hypothesis, Di Mango et al$^{64}$ compared the changes in $R_e$, $S$, and $R_m$ measured with the FOT to those in FEV$_1$ in 12 normal subjects, 22 patients with COPD, and eleven asthmatics after salbutamol inhalation. Percentile variations of the difference between postbronchodilator and prebronchodilator values were used to express reversibility of airway obstruction. The inhalation of salbutamol resulted in nonsignificant changes in $R_e$ and $S$ and a reduction in $R_m$ in the control group. Higher changes and significant reductions in $R_e$, $R_m$, and $S$ were observed in COPD and asthmatic patients. In the COPD group, the variations were smaller than observed in asthmatics.

In a later study,$^{65}$ the effect of albuterol on respiratory resistance and reactance was evaluated in 70 patients divided into two groups based on spirometry findings: bronchodilator-negative (n=39) and bronchodilator-positive (n=31). It observed significantly smaller values in $R_e$ ($P<0.00002$) and $R_m$ ($P<0.0002$). Increased values were observed in $S$ ($P<0.0001$), as well as in $C_{dp}$ ($P<0.0001$) and $X_m$ ($P<0.00004$). The cited changes occurred in the two studied groups, and the changes in FOT parameters were higher than those found for spirometric parameters. The authors concluded that the use of albuterol may improve respiratory resistance and reactance in COPD patients, in spite of the FEV$_1$-based classification. Therefore, these results provide evidence that the use of FEV$_1$ alone may not be sufficient to adequately detect all of the physiological changes involved.

Continuing this research, da Costa et al$^{66}$ investigated the effects of airway obstruction on bronchodilator response and evaluated the utility of the FOT as a complementary measurement in this analysis. This study was conducted in
25 healthy individuals and 82 patients with COPD assessed with the FOT followed by spirometry before and after the use of salbutamol. The changes exhibited by the COPD subgroups were greater than in the healthy individuals ($P<0.05$). Increased obstruction resulted in decreased reductions in $R_m$ and increased improvements in $X_m$ ($P<0.001$). In addition, bronchodilation reduced ventilation heterogeneity and the impedance modulus in all COPD stages ($P<0.05$). The correlation coefficients for the spirometric and FOT changes were low (0.21–0.38). The authors concluded that in the initial phases of COPD (stage I), the effects of bronchodilation were greater than in healthy volunteers. Bronchodilator use improved the oscillatory mechanics in all of the studied groups of COPD patients. These improvements are reduced in more advanced phases of airway obstruction (II–IV).

Pulmonary function analysis based on the FOT provides information that complements the data supplied by spirometry, contributing to an improvement in the evaluation of bronchodilator response in COPD.

Improvement of diagnostic accuracy of pulmonary function tests using clinical decision-support systems Interpretation of the FOT results, resistance and reactance curves, and the associated indices requires adequate expertise. In diagnostic use, it may be a difficult task for the pulmonologist that is not familiar with this method. In addition, the GOLD consensus recently noted that diagnostic simplicity is a key feature for the busy nonspecialist clinician.

Several previous studies have shown that efficient clinical decision-support systems may be developed based on machine-learning (ML) methods. After being optimized to perform adequate classifications by learning from well-controlled examples, these programs can obtain information from different categories of signals. Therefore, an important question is: may an ML-based system associated with FOT measurements provide an accurate method to identify COPD? Only a small number of recent studies have investigated this question. These studies, however, were based on impulse-oscillation systems, which present differences from classical FOT. These differences are related to the measurement method, data analysis, and related parameters.

In this context, our group has developed and tested several clinical decision-support systems based on ML to simplify the diagnostic of COPD using FOT. The initial system was implemented using artificial neural networks (ANNs) and measurements performed in 15 normal volunteers and 15 COPD patients. The system presented adequate accuracy (Se, Sp, and AUC > 0.9). This initial result provided evidence that ANN-based clinical decision-support systems can facilitate the diagnosis of COPD by pulmonary function analysis based on the FOT.

Based on these promising findings, a second study was performed using 25 normal volunteers and 25 patients with COPD. This work included the ANN used in the previous study and six other ML methods. The best classifiers reached very accurate performance (Se ≥ 0.87, Sp ≥ 0.94, and AUC ≥ 0.95). A perfect performance was obtained using one of these classifiers (Se, Sp, and accuracy = 1). This proved the feasibility of developing an automatic system based on ML algorithms to support clinical decisions, simplifying the diagnosis of COPD by the FOT.

There is general agreement in the literature that the detection of early smoking-induced respiratory changes while these pathologic changes are still potentially reversible is of utmost importance in the prevention of COPD. Therefore, the purpose of the next step of this line of research was the development of a clinical decision-support system to improve the accuracy of the FOT for detecting precocious respiratory abnormalities in smoking patients. The study was based on FOT measurements performed in 56 volunteers, 28 controls, and 28 light smokers (11.2 ± 7.3 pack-years). The established baseline was the ROC curve of the most accurate FOT parameter. A tenfold cross-validation using the mean AUC was used to determine the best classifier. A significant improvement in accuracy (0.91) compared with the baseline (0.77) was observed, which allowed for high diagnostic accuracy. These results provide evidence that ML algorithms can improve the accuracy of pulmonary function analysis, contributing to clinical diagnosis of early smoking-induced respiratory changes.

The majority of patients with COPD follow a path of disease progression that tracks the severity of airway obstruction. Therefore, the assessment of airway-obstruction severity is crucial to evaluate the risk of future exacerbations and to guide therapy. Automatic classifiers could contribute to the simplification of the clinical use and increase in the accuracy of the FOT in the categorization of airway-obstruction level in COPD. The study included 168 volunteers, 42 healthy subjects, and 126 COPD subjects, who were classified according to the GOLD criteria as having mild ($n=24$), moderate ($n=50$), severe ($n=37$), or very severe ($n=15$) airway obstruction. Initially, it was showed that FOT parameters alone did not allow high accuracy (AUC ≥ 0.90) in diagnosing COPD patients in the first levels of airway obstruction or in discrimination between close levels of obstruction. Therefore, ML algorithms were applied only in situations where high categorization accuracy (AUC ≥ 0.9) was not
achieved with the FOT parameter alone. These situations are illustrated in Figure 5.

It was observed that the use of ML techniques improved categorization accuracy (Figure 5). Noticeably, an AUC ≥ 0.9 was obtained in four of the six studied conditions. A significant improvement in categorization performance was even observed in conditions where high accuracy was not achieved (AUC increases from 0.80 to 0.87 and 0.74 to 0.83). These results show that decision-support systems based on ML classifiers can improve the categorization of COPD. These systems may help clinicians in the evaluation of disease progression, risk of exacerbations, and therapy management, contributing to an improvement in the medical services offered to patients with COPD.

Pulmonary function analysis based on systems medicine and complexity measurements

Historically, since Descartes and the Renaissance, reductionism has been the main paradigm in medicine. Although this method has been responsible for tremendous successes in modern medicine, there are also limitations, mainly in the understanding of highly complex diseases like COPD. Complex biological systems cannot be understood only as a sum of their individual parts, and a complementary description must be developed. In this sense, the use of a systems perspective is presently part of an active debate in the respiratory medicine literature. This perspective investigates the integrative characteristics of a disease, rather than dividing a complex problem into its parts, as traditionally performed in reductionist analysis. Considering the respiratory system’s highly complex structure and function, a systems perspective has been suggested to understanding the respiratory diseases. It is widely known that respiratory functions often present complex behavior. This is an important characteristic, since it may provide clinically relevant information, because complexity appears to be lost in the presence of an illness. Goldberger proposed that the increased regularity of signals represents a “decomplexification” characteristic of illness. According to this hypothesis, health is characterized by “organized variability”, and disease is defined by “decomplexification”, increased regularity, and a reduction in variability. These methods have a rich literature in cardiovascular medicine, with important impact on clinical practice. However, they are just beginning to be used in respiratory physiology and pulmonary function analysis.

Dames et al investigated the influence of airflow obstruction in the complexity of the airflow pattern in COPD and its use as a marker of disease activity. It was observed that airflow patterns in COPD exhibited reduced complexity, measured by the sample entropy of the airflow, compared with healthy subjects. Interestingly, airflow obstruction resulted in a reduction in complexity that was significantly correlated with spirometric indices of airflow obstruction. Early changes due to mild airflow obstruction were detected by the sample entropy of the airflow, compared with healthy subjects. Interestingly, airflow obstruction resulted in a reduction in complexity that was significantly correlated with spirometric indices of airflow obstruction. Early changes due to mild airflow obstruction were detected by the sample entropy of the airflow, compared with healthy subjects.

What are the gaps? Possible future directions

The FEV₁:FVC criterion for COPD functional diagnosis is simple, independent of reference values, and has been used in numerous clinical trials. However, new COPD functional diagnosis indices have been sought by many Brazilians researchers, and the use of the FEV₁:FV.csv ratio has been intensely debated. Different from other screening exams that have high Se, the FEV₁:FV.csv ratio may be useful to exclude patients with COPD, and not to identify them. Validation of FEV₁:FV.csv for other devices using larger

Figure 5 Comparisons of the diagnostic accuracy (area under the ROC curve) obtained using the best FOT parameter (BFP) and FOT + best ML methods.

Note: All: all COPD patients; G1: mild airway obstruction; G2: moderate; G3: severe; G4: very severe airway obstruction.

Abbreviations: FOT, forced-oscillation technique; ML, machine learning; ROC, receiver-operating characteristic.
samples and the evaluation of its correlation with clinical outcomes may be of great interest in future trials.

The pharmacodynamic test evaluates the immediate functional changes resulting from a change in bronchial muscle tone, which is one of the elements responsible for the genesis of the obstructive process. Tavares et al\textsuperscript{15} demonstrated that there were responses in RV, specific airway conductance, IC, and slow VC among patients presenting no FEV\textsubscript{1} response. The authors recognized that functional outcomes other than FEV\textsubscript{1} are useful for determining the reversibility of COPD and must be used to assess more accurately the extent of bronchodilator response in COPD patients. Therefore, new studies should focus on the association between pharmacodynamic response with parameters obtained through plethysmography or oscillometry and clinical outcomes that reflect ADLs.

In Brazil, some researchers have used static lung volumes to seek new markers of COPD severity, progression, and prognosis.\textsuperscript{18,19,23} The IC, and in particular the IC:TLC ratio, was shown to be important markers of exercise intolerance, and possibly are prognostic indicators. However, additional research is necessary to estimate more accurately disease severity and prognosis in COPD patients. It is necessary to conduct longitudinal trials with large number of participants, in order to evaluate how the possible markers of COPD severity, as well as their respective cutoff points, predict disease progression and prognosis in a particular patient.\textsuperscript{28}

The progression of COPD is associated with impaired quality of life, increased breathlessness, and exercise intolerance. DH caused by expiratory flow limitation is markedly increased in many COPD patients. Indeed, the findings of several Brazilian studies support the concept that DH plays an important role as an etiological factor in exercise limitation in COPD patients.\textsuperscript{28,29} However, these studies did not measure static lung volumes at rest, and changes in lung volumes were estimated exclusively by IC rather than by end-expiratory lung volume. Therefore, new studies addressing this issue may be of interest to the advancement of current knowledge.

Ventilation inhomogeneity contributes to health status, degree of dyspnea, and functional exercise capacity in COPD patients. The N\textsubscript{2}SBW test is thought to be useful for stratifying patients and assessing COPD severity. In Brazil, the main merit of the Lopes and Mafort study was that it was the first to evaluate the association between N\textsubscript{2}SBW parameters and functional exercise capacity as measured by 6MWD in COPD patients. However, longitudinal studies are needed, especially in randomized cohorts and with a greater number of individuals, to confirm the importance of their findings.\textsuperscript{37} Importantly, the N\textsubscript{2}SBW test should be used to evaluate patients with more severe COPD, as well as the relationship between the N\textsubscript{2}SBW Phase III slope and oxygen consumption during incremental testing.

A significant proportion of patients with COPD show abnormalities in TM and breathing pattern. The characterization of these changes at different COPD stages, and its association with ventilation and diaphragmatic function, may provide better pathophysiological understanding and adequate therapeutic planning. Furthermore, future studies are necessary to evaluate the effect of supplemental oxygen on breathing pattern in COPD patients.\textsuperscript{46}

Exacerbations of COPD lead to significant deleterious effects on the patient’s health-related quality of life and can greatly increase resource utilization and cost to the health care system.\textsuperscript{93} Recently, the European Commission on Telemedicine\textsuperscript{41} emphasized the high clinical potential of telemedicine in COPD and the urgent demand for research in this area. The ability of the FOT to evaluate respiratory mechanics during tidal breathing could simplify unsupervised pulmonary function monitoring. However, this depends on the development of specialized systems and protocols.\textsuperscript{95,96} FOT measurements associated with telemonitoring hold the promise of improving our comprehension and the administration of COPD, as well as its exacerbation. This method has the potential to provide risk predictors on a personal basis. This may contribute to evaluation of the efficacy of treatment and/or disease handling in COPD.

From a long-term perspective, future studies may improve the understanding and management of COPD and its exacerbations by integrating ML algorithms and home pulmonary function monitoring using the FOT and telemedicine services. Clinical decision-support systems may also contribute to increasing the accuracy in differential diagnoses between COPD and asthma, which may prevent substantial morbidity.\textsuperscript{97,98}

**Conclusion**

Since the beginning of this millennium, research on lung function in COPD patients has been gradually increasing in Brazil. These studies used not only traditional methods but also new techniques recently incorporated in the evaluation of pulmonary function. The authors propose new COPD functional diagnosis indices, as well as new functional markers of disease severity, that are associated with quality of life, exercise tolerance, and prognosis. Some Brazilian researchers have assessed the impact of ADLs on the DH in COPD patients, while others have studied the relationship between
the N-SBW test and 6MWD in these patients. Interestingly, the FOT was used in a series of studies in COPD patients and showed promising results. Finally, some research has focused on automatic clinical decision-support systems and complexity measurements. Further investigations using prospective and longitudinal design may be of interest to elucidate the use of these new methods in the diagnosis and prevention of COPD.

Acknowledgments
The Brazilian Council for Scientific and Technological Development (CNPq) and Rio de Janeiro State Research Supporting Foundation (FAPERJ) supported this study.

Disclosure
The authors report no conflicts of interest in this work.

References


