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# Lung Injury Induced by Secondhand Smoke Exposure Detected with Hyperpolarized Helium-3 Diffusion MR

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# Abstract

**Purpose**—To determine whether helium-3 diffusion MR can detect the changes in the lungs of healthy nonsmoking individuals who were regularly exposed to secondhand smoke.

**Materials and Methods**—Three groups were studied (Age:  $59\pm9$  years): 23 smokers, 37 exposure-to-secondhand-smoke subjects, and 29 control subjects. We measured helium-3 diffusion values at diffusion times from 0.23 to 1.97 seconds.

**Results**—One-Way ANOVA revealed that the mean area under the helium-3 diffusion curves (ADC AUC) of the smokers was significantly elevated compared to the controls and to the exposure-to-secondhand-smoke subjects (P < 0.001 both). No difference between the mean ADC AUC of the exposure-to-secondhand-smoke subjects and that of the controls was found (P=0.115). However, application of a receiver operator characteristic derived rule to classify subjects as either a "control" or a "smoker", based on ADC AUC, revealed that 30% (11/37) of the exposure-to-secondhand subjects were classified as "smokers" indicating an elevation of the ADC AUC.

**Conclusion**—Using helium-3 diffusion MR, elevated ADC values were detected in 30% of nonsmoking healthy subjects who had been regularly exposed to secondhand smoke, supporting the concept that, in susceptible individuals, secondhand smoke causes mild lung damage.

## Keywords

Helium-3 MRI; diffusion MRI; secondhand smoke; emphysema; ADC

# INTRODUCTION

Exposure to secondhand tobacco smoke, which consists of smoke from burning tobacco in cigarettes, cigars or pipes and smoke exhaled by smokers, is an established cause of lung

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cancer and coronary artery disease in healthy nonsmoking individuals (1). A causal relationship between exposure to secondhand smoke and the development of chronic obstructive pulmonary disease (COPD) is less clear since the results from a variety of studies, some of which involved large study populations, are contradictory with some showing no effects and others finding minor changes (1–8).

Hyperpolarized helium-3 is a gaseous contrast agent for magnetic resonance imaging (MRI) that provides high-resolution images of the lung airspaces after the gas is inhaled (9–12). By using specific MR pulse-sequences, the diffusivity of the gas, which reflects the displacement of the helium-3 atoms due to random thermal motion, can be measured. In the airspaces of the lung, the diffusion of helium-3 atoms is restricted by the alveolar walls and associated structures. This restricted diffusion, denoted as the Apparent Diffusion Coefficient (ADC) (13), is relatively low in healthy subjects due to the uniformly small dimensions of the distal lung airspaces (14–17). When there is damage or destruction of the alveolar walls as happens in emphysema, the airspaces enlarge and as a result, the measured helium-3 diffusion increases leading to ADC values that are greater than those found in healthy individuals (14–16). Studies in animal models of emphysema have shown a strong correlation between the helium-3 ADC and the histological measurement of alveolar size (15, 18). Elevated ADC values have also been demonstrated in smokers who were otherwise healthy, had normal lung function, and had no other lung diseases. This suggests that hyperpolarized helium-3 diffusion MR may be highly sensitive to early structural changes in emphysema (19, 20). However, it is unknown whether helium-3 diffusion MR can detect similar changes in individuals who have never smoked themselves but have been regularly exposed to secondhand smoke for a considerable period of time.

The purpose of this study was to determine whether helium-3 diffusion MR can detect changes in the lungs of healthy nonsmoking individuals who were regularly exposed to secondhand smoke. Since only 20–35% of heavy smokers developed clinical COPD, we expect that only a portion of healthy non-smoking individuals with high secondhand smoke exposure will have elevated helium-3 diffusivity (21–26). The presence of such findings would support the concept that exposure to secondhand smoke in susceptible individuals leads to lung injury and possibly subclinical emphysema.

# MATERIALS AND METHODS

#### **Participants**

Three groups of subjects were recruited from the local community by advertisement: Subjects who smoked actively or were prior smokers (smoker group), healthy subjects who had never smoked themselves but had regular exposure to secondhand smoke (exposure-to-secondhand-smoke group), and healthy subjects who had never smoked and only had occasional exposure to secondhand smoke (control group). The smoker group consisted of current and former smokers with a self-reported smoking history of at least 6 pack-years. Exclusion criteria for the exposure-to-secondhand-smoke and control groups were a personal history of active smoking, abnormal spirometry defined as a forced expiratory volume in the first second (FEV<sub>1</sub>) < 80% predicted or the portion of the forced vital capacity exhaled in the first second (FEV<sub>1</sub>/FVC) < 70%, a history of chronic lung disease, symptoms of asthma or

other lung disease, allergies, or a history of pneumonia requiring hospitalization. Requirement for the exposure-to-secondhand-smoke subjects was that they had never smoked themselves but had lived for at least 10 years with a smoker who smoked in the home. Requirement for the controls was that they had never lived with a smoker, were never employed in an occupation with high secondhand smoke exposure, such as bartender or flight attendant, and never shared an office with a smoker. To minimize the influence of age, only subjects older than 40 years were recruited. A total of 89 subjects were enrolled in the study, including 23 in the smoker group, 37 in the exposure-to-secondhand-smoke group, and 29 in the control group. The smokers reported an average smoking history of  $45 \pm 27$  pack years.

The study was performed under an institutional review board approved protocol, and informed written consent was obtained from all subjects. In addition, all imaging was performed under an FDA-approved investigational new drug application (IND # 57,866) for hyperpolarized helium-3 as an inhaled MR contrast agent.

#### **Study Design**

Each subject made one study visit during which gender, age, weight, height, and a medical history, including details on personal smoking and secondhand smoke exposure, were assessed. During the same visit, spirometry and hyperpolarized helium-3 diffusion MR were performed. Spirometry was performed seated (PB100, Puritan Bennett; Lenexa, KS) using the Knudson tables for predicted normal limits (27). Hyperpolarized helium-3 diffusion MR was performed using a 1.5-T commercial scanner (Magnetom Sonata, Siemens Medical Solutions, Malvern, PA) equipped with the multi-nuclear imaging package and a flexible, vest-shaped chest RF coil (Clinical MR Solutions, Brookfield, WI) tuned to the helium-3 resonance frequency.

The helium-3 gas was polarized by collisional spin exchange with an optically-pumped rubidium vapor using a commercial system (Model 9600 Helium Polarizer; Magnetic Imaging Technologies Inc., Durham, NC) (28); polarizations of 27% - 37% were achieved. Immediately prior to imaging, approximately 50 ml of hyperpolarized helium-3 gas was dispensed into a Tedlar bag (Jensen Inert Products, Coral Springs, FL), and medical grade N<sub>2</sub> was added to yield a total volume that was approximately 1/3 of the subject's forced vital capacity (FVC). The bag was transported to the scanner room where the gas mixture was inhaled through a small plastic straw by the study subject while positioned supine in the MR scanner. All subjects were instructed to exhale completely (e.g. to residual volume) immediately prior to inhaling helium-3 gas mixture.

Hyperpolarized helium-3 diffusion MR was performed during breath holding immediately following inhalation of the gas mixture. Since the optimal diffusion time for detecting smoking-related lung changes was unknown, a diffusion MR pulse sequence was used that obtained global (whole lung) data for 29 different diffusion times during a single breath hold lasting less than 10 seconds (29). The diffusion times were equally spaced with the gap of 62 ms between a minimum value of 0.23 s and a maximum value of 1.97 s. The key imaging parameters included: tag wavelength (the wavelength of the sinusoidal modulation for longitudinal magnetization), 10 mm; flip angle, 5°; readout bandwidth, 1500 Hz/pixel; and

diffusion-sensitization direction, anterior-posterior. Additional details of the pulse sequence are described in Ref (29). Following the MR acquisition, the data were transferred from the MR scanner to a personal computer, and the ADC values were calculated at each diffusion time using an in-house program written in MATLAB (The Math Works, Inc, Natick, MA) (29).

#### **Statistical Analysis**

**Demographics and Spirometry**—Demographic categorical data were analyzed via the Pearson chi-squared test. Continuous scaled demographic and spirometry data were analyzed via One-way ANOVA.

**Helium-3 ADC Analysis**—We measured the ADC values at a series of diffusion times from 0.23 to 1.97 s. Rather than to compare the ADC values at a single diffusion time, we calculated the area under ADC time-profile curve (ADC AUC) (the integral of the ADC from 0.23 to 1.97 s) as a summary measure of the subject-specific ADC time-profile. A Principal Component Analysis of the ADC time-profile curve was used to determine whether the ADC AUC is a good summary measure, that is whether it captures most of the information in the ADC time-profile curve (30). After that, the ADC AUC data were analyzed via One-Way ANOVA and between-group comparisons of mean ADC AUC were conducted via the Welch t-test (31). A P 0.05 decision rule was utilized as the criterion for rejecting the null hypothesis of equal means.

Since only a fraction of heavy smokers (~20-35%) develop clinical COPD (21–26), we expect that at most a similar fraction of the exposure-to-secondhand-smoke subjects would have elevations in the measured ADC values and that the magnitude of the elevations in ADC would be much smaller than that found in the smokers. To detect a small change that occurs in only a fraction of the exposure-to-secondhand-smoke subjects, we used the ADC AUC data from the smoker and control group to develop an optimal classification rule for classifying a subject as a "control" or a "smoker" based on a receiver operator characteristic (ROC) analysis (32, 33). We then applied this classification rule to the exposure-to-secondhand-smoke group to determine the percentage of these subjects classified as a "smoker". To determine a plausible range for the 95% confidence interval of this percentage, we used the bootstrap method as described below (34).

**Classification Rule Development**—Let  $Y_i$  be an indicator variable that equals the value 1 if subject *i* belongs to the smoker group and equals the value 0 if the subject *i* belongs to the control group. Let ADC AUC<sub>i</sub> denote the value for the integrated area under the ADC

profile curve of subject *i*. Let  $\hat{p}_i = \frac{exp[\hat{\beta}_o + \hat{\beta}_1(\text{ADC AUC}_i)]}{1 + exp[\hat{\beta}_o + \hat{\beta}_1(\text{ADC AUC}_i)]}$  denote the logistic regression predicted probability that subject *i* belongs to the "smoker group" based on ADC AUC of subject *i* ( $\beta_0$  is the intercept from the linear regression equation while  $\beta_1$  is the regression coefficient). Let *p* denote a cutoff point in the unit interval [0, 1], such that if  $\hat{p}_i$  *p* subject *i* is classified as a "smoker" and as a "control" otherwise. Let *p*optimum be the value of the cutoff point *p* that minimizes the false classification error rate across all controls and smokers.

To find  $p_{optimum}$  we first produce an empirical receiver operator characteristic curve of the relationship between the true positive (TP) and the false positive (FP) probabilities of classification based on a 0.001 incremental sequence of cutoff point values p in the unit

classification based on a 0.001 incremental sequence of cutoff point values p in the unit interval [0, 1]. Then by utilizing the two parameter (i.e. R and E are fitting parameters to specify the functional form of the ROC curve as weighted exponential) exponential model of England: TP=R·FP<sup>[1/E]</sup>+(1-R)·[1-(1-FP)<sup>[E]</sup>] (33), we estimate TP as a smooth function of FP. The next step in finding  $p_{optimum}$  is to find the optimum threshold point t on the exponential ROC curve (EROC) such that the false classification error rate is minimized. The final step in finding  $p_{optimum}$  is to find the cutoff point p that produces a 2 × 2 cross classification table which matches the EROC optimum FP and FN error rates.

After *p<sub>optimum</sub>* is determined, the optimum classification rule was applied to the ADC AUC values of the exposure-to-secondhand-smoke subjects to determine what proportion of these individuals would be classified as a "smoker".

Finally, a plausible range of values (95% confidence interval) for the true percentage of exposed-to-secondhand-smoke subjects who would be classified as a "smoker" based on their ADC AUC was derived via the bootstrap resampling methods of Efron and Tibshirani (34).

Bootstrap 95% Confidence Interval Construction—The resampling methods of Efron and Tibshirani were utilized to derive the bootstrap sampling distribution for the percentage of exposed-to-secondhand-smoke subjects in the target population who would be classified via the optimum threshold classification rule as a "smoker" based on their ADC AUC values (34). At each of 10,000 bootstrap sampling repetitions, ADC AUC measurements were randomly selected with replacement from the set of all ADC AUC measurements of the exposure-to-secondhand-smoke group. Each ADC AUC measurement in the bootstrap sample was then inserted into the original logistic regression equation (i.e. the equation that was optimize to predict the log-odds of being a smoker based on the ADC AUC measurements of the controls and the smokers) and the prediction  $(\hat{p}_i)$  for the probability of being a smoker was calculated. Utilizing the individual  $\hat{p}_i$ , as well as the optimum threshold cutoff probability ( $p_{optimum}$ ), each of the selected ADC AUC measurements in the random sample was classified as either a "control" or a "smoker". Based on the classifications generated by the 10,000 bootstrap samples, we estimated the bootstrap frequency distribution, and the bootstrap cumulative distribution function for the percentage of exposed-to-secondhand-smoke subjects in the study population who would be classified via the optimum threshold classification rule as a "smoker" based on their ADC AUC measurements. The cumulative distribution function was then used to determine the lower and the upper limits of the bootstrap 95% confidence interval.

**Statistical Software**—The aforementioned analyses were conducted with the software of SAS version 9.2 (SAS Institute Inc., Cary, NC) and Spotfire Splus 8.1 (TIBCO Inc., Palo Alto, CA).

# RESULTS

#### **Demographics and Spirometry**

There were no significant differences in age, gender, height, weight or Body Mass Index (BMI) between the three groups, Table 1. Either  $FEV_1\%$  predicted or  $FEV_1/FVC$  was abnormal in 14 (61%) of 23 smokers, and both were normal in the remaining 9 smokers. Of the 37 exposure-to-secondhand-smoke subjects, 34 (92%) had been exposed for at least 10 years at home during their childhood and 19 (56%) of these also had lived with one or more smokers for 5 or more years during adulthood. Only one (3%) was exposed only as an adult.

For the exposure-to-secondhand-smoke and the control groups, the FEV<sub>1</sub>% predicted and FEV<sub>1</sub>/FVC were normal for all subjects, and there were no significant differences in spirometry indices between these two groups (P > 0.436), Table 1.

#### Helium-3 ADC Analysis

The ADC values as a function of the diffusion time for the controls, exposure-tosecondhand-smoke subjects, and smokers are displayed in Figure 1. A Principal Components Analysis showed that 97.1% of the variations in the ADC measurements were explained by the first principal component score and a subsequent linear regression analysis showed that over 99.8% of the variations in the first principal component score were explained by the ADC AUC, proving that ADC AUC is a good summary measure of the ADC time-profile (30). The corresponding measurements for ADC AUC for each group are displayed in Figure 2. The corresponding ADC AUC are  $0.04 \pm 0.01$ ,  $0.05 \pm 0.02$  and  $0.08 \pm 0.03$  (cm<sup>2</sup> [0.23 s - 1.97 s]), respectively for the controls, exposure-to-secondhand-smoke subjects and smokers.

As expected, the One-Way ANOVA analysis indicated that the mean of the ADC AUC differed between the controls and the smokers  $(0.04 \pm 0.01 \text{ vs}, 0.08 \pm 0.03, P < 0.001)$ . Similarly, the One-Way ANOVA analysis indicated that the mean of the ADC AUC differed between the exposure-to-secondhand-smoke subjects and smokers  $(0.05 \pm 0.02 \text{ vs}, 0.08 \pm 0.03, P < 0.001)$ . Not surprisingly, the One-Way ANOVA analysis failed to indicate that the mean of ADC AUC differed between the controls and exposure-to-secondhand-smoke subjects  $(0.04 \pm 0.01 \text{ vs}, 0.05 \pm 0.02, P = 0.115)$ 

#### **Classification Rule Performance**

The ROC and EROC curves that were generated from the predictions of the logistic regression model, in which the ADC AUC measurements from the controls and smokers were utilized as the predictor of smoking status, are displayed in the Figure 3 (32, 33). At the optimum threshold cutoff probability, the specificity of the classification rule was 0.83, and the sensitivity of the classification rule was also 0.83. Out of the 23 smokers, 4 were misclassified as controls (false negative (FN) error rate = 17%), while out of the 29 controls, 5 were misclassified as smokers (false positive (FP) error rate = 17%). Area under the EROC was 0.90, Table 2.

#### Classification of the Exposed-to-Secondhand-Smoke Subjects

Applying the optimum threshold classification rule to the ADC AUC data of the 37 exposure-to-secondhand-smoke subjects resulted in 11 out the 37 subjects (30%) being classified a "smoker". Based on the bootstrap cumulative sampling distribution function as in Figure 4b, the 95% confidence interval for the percentage of exposure-to-secondhand-smoke subjects who would be classified "smokers" via the optimum classification rule extends from 16% to 46%.

# DISCUSSION

Two important observations were made in this study. First, the ADC AUC values of the smokers were significantly elevated compared to those of the non-smoking healthy subjects. This is not surprising considering that the ADC is sensitive to detect increases in the size and connections of the distal lung airspaces and can thus detect the early structural changes of emphysema that occur in subjects who have smoked for a considerable time (14–16). The second and more striking observation was the ADC AUC was also found to be elevated/ abnormal in 30% of the exposure-to-secondhand-smoke subjects (16% - 46%, 95% confidence interval). Although these elevations were not as large as those found in the smokers, the findings indicate that there were changes in the microstructure of the lungs of some of the healthy non-smoking subjects who had been exposed for a prolonged period to secondhand smoke.

Although it has long been postulated that exposure to secondhand smoke damages the lung and may lead to COPD, this has been difficult to prove (1–8, 35). In most studies spirometry or pulmonary function tests were used as the endpoint and such approaches are inherently insensitive because a considerable fraction of the lung must be damaged before changes in lung function are detectable (36, 37). Our findings suggest that hyperpolarized helium-3 diffusion MR is a more sensitive test than spirometry for detecting the early alterations of the lung structure that may be associated to prolonged exposure to secondhand smoke. Further, that the percentage of subjects with elevated ADC from secondhand smoke exposure is similar to the percentage of heavy smokers who develop clinical COPD suggests that there may a subgroup of the population that is particularly susceptible to the deleterious effects of cigarette smoke (26).

The vast majority of subjects in our exposure-to-secondhand-smoke group were exposed during childhood, and a number of these also had substantial additional exposure as an adult. Unfortunately, due to the relatively low number of subjects, we were not able to determine whether there were any differences in ADC between those exposed only in childhood compared to those with exposure only as an adult. As a result, we were not able to assess whether prolonged exposure to secondhand smoke during childhood is potentially more damaging than inhalation as an adult, but future studies using hyperpolarized helium-3 diffusion MR might address this issue.

Alveolar destruction induced by cigarette smoke is not the only process that has been associated with an increase in helium-3 ADC values. In a recent study involving subjects with difficult-to-treat asthma and no history of active or prior smoking, ADC values were

elevated compared to healthy subjects (38). It is uncertain what these alterations represented in this group of patients, particularly since asthma is not primarily an alveolar-destructing disease such as emphysema; possibly the changes were related to airway remodeling after chronic inflammation. However, in this study exposure to secondhand smoke was not assessed, and therefore it is uncertain whether tobacco smoke had any effect on these findings. Nevertheless, other airway diseases may also lead to increases in helium-3 diffusion detectable with diffusion MR. Thus, the results of our current study involving healthy subjects with extensive exposure to secondhand smoke should be interpreted as indicative of lung injury but it is unclear whether this is subclinical emphysema, related to an airway process, or another form of lung injury. To better understand the types of structural changes underlying our observations, smoking animal models could be used to determine whether early-stage emphysema can be detected with our method.

To our knowledge there has only been one prior study investigating the effects of secondhand smoke using hyperpolarized helium-3 diffusion MR (39). In this study 13 subjects with such exposure had elevated ADC values compared to 11 never smokers with normal values. However, the study is limited because of the small number of subjects, the unmatched population age, and the criteria for the intensity and duration of secondhand smoke exposure were not defined.

A limitation of our method of measuring the ADC globally over the entire lung was that it did not provide information about regional differences in ADC values, and thus we could not determine which areas of the lung were most affected. Wang et al. previously developed an MRI pulse sequence that provides regional maps of the ADC values at a specific diffusion time. And this technique was found to be more discriminatory than other studies (29, 38). It could potentially increase our understanding of the local effects of secondhand smoke in the lung by using this technique.

In conclusion, 30% of non-smoking healthy subjects who had prolonged exposure to secondhand smoke, and who had normal lung function and no other lung disease had abnormalities in helium-3 diffusion that were similar to those found in smokers, albeit to a lesser degree. These abnormalities likely reflect lung injury from exposure to secondhand smoke, although it is uncertain whether these abnormalities represent subclinical emphysema. Hyperpolarized helium-3 diffusion MR appears to be a sensitive test for assessing the potential harmful effects of secondhand smoke in the lung.

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Wang et al.



#### Figure 1.

ADC values as a function of diffusion time for the three groups over the range of diffusion times from 0.23 to 1.97 s. (a) Control; (b) Exposure-to-secondhand-smoke; and (c) smoker. Horizontal dotted lines are lines of reference.

Wang et al.



## Figure 2.

Empirical (observed data) distributions for ADC AUC, displayed as box-whisker plots, with the lower whisker defining the minimum value of ADC AUC, the upper whisker defining the maximum value, the box defining the inter-quartile range between the values at the 25<sup>th</sup> and 75<sup>th</sup> percentiles of the distribution, and the horizontal line extending through the box defining the location of median of the distribution. There is considerable overlap of values but in both the Exposed-to-Secondhand-Smoke group and the Smoker group, there are more outliers.

Wang et al.



#### Figure 3.

(a) Empirical ROC and exponential ROC (EROC) and (b) false classification relationship as a function of the cutoff probability.

Wang et al.



#### Figure 4.

(a) Bootstrap sampling frequency distribution and (b) bootstrap sampling cumulative distribution for the percentage of the exposed-to-secondhand smoke individuals in the target population who would be classified "smokers" based on their ADC AUC values and the optimum threshold classification rule. The bootstrap frequency distribution and the bootstrap cumulative distribution function were generated based on 10,000 bootstrap random samples of size 37 (i.e. sampling with replacement) drawn from the sample of 37 exposed to second hand smoke subjects.

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Demographic and spirometric data for all subjects.

Variable	Control (n=29)	Exposure-to- secondhand- smoke (n=37)	Smoker (n=23)		<i>P</i> value	
				$H_0$ <sup>2</sup>	Ho <sup>3</sup> Pairwise Comp	arison
Gender	12M, 17F	9M, 28F	7M, 16F	0.331		
Age $(yrs)^I$	57.3±9.0	58.9±8.3	$61.0 \pm 8.3$	0.324		
Height $(cm)^{I}$	$168.4 \pm 8.1$	$164.4{\pm}8.6$	$167.6 \pm 8.4$	0.135		
Weight $(kg)^{I}$	78.4±12.8	74.5±14.9	70.4±16.6	0.159		
$BMI^I$	27.5±3.2	27.5±4.9	25.0±5.6	0.148		
$\mathrm{FEV}_1\%_{\mathrm{predicted}}I$	98.7±9.1	98.6±11.7	77.0±25.1	<0.001	Cont vs. ESS Cont vs. Smok <sup>6</sup> ESS vs. Smok	0.981 <0.001 <0.001
FEV <sub>1</sub> /FVC <sup>1</sup>	78.5±4.1	77.7±4.3	64.2±15.2	<0.001	Cont vs. ESS Cont vs. Smok ESS vs Smok	0.436 <0.001 <0.001
, Values are mean±	SD (standard	deviation).				
, Ho: Null Hypothe	ssis: Categoric	al: Homogenous:	proportions.	Continuou	s: All means equal.	
z Ho: Null Hypothe	ssis: Equal me	ans.				
f Cont: Control.						
ر ESS: Exposure-to	-secondhand-	smoke.				
5 Smok: Smoker.						

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					ROC <sup>§</sup>	06.0	
	u	53	67	54	False Negative (FN) Error Rate *	0.174	
cted	Control	4	24		False Positive (FP) Error Rate $^+$	0.172	
Predi	Smoker	19	5		Sensitivity <sup>‡</sup>	0.826	
	Actual	Smoker	Control		Specificity $^{\dagger}$	0.828	
					Optimal Threshold Cutoff Probability $P_{optimum}$	0.301	

 $\dot{\tau}$  the conditional probability that the classification rule classified the subject as a member of the smoking group when the subject was actually a member of the control group.  $_{\star}^{*}$  the conditional probability that the classification rule classified the subject as a member of the control group when the subject was actually a member of the smoking group. t the condition probability that the classification rule classified the subject as a member of the smoking group when the subject was actually a member of the smoking group. <sup>7</sup>the conditional probability that the classification rule classified the subject as a member of the control group when the subject was actually a member of the control group. \$ the integrated area under the receiver operator curve (ROC): with range [0.5 (denoting random classification) to 1.0 (denoting perfect classification)].