# Unraveling the Difference in the Composition/Content of the Aroma Compounds in Different Tobacco Leaves: For Better Use 

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#### Abstract

The composition/content of aroma compounds in tobacco leaves in the different producing areas varies too much, and it is very meaningful to develop advanced analysis techniques to investigate the composition/content-producing area correlation. Here, gas chromatography-ion mobility spectroscopy (GC-IMS) was used to analyze the composition/content of aroma compounds in tobacco samples from eight different producing areas. With this technique, ion mobility spectrum, differential ion mobility spectrum, and fingerprint spectrum were constructed for two-dimensional analysis. Then, the principal component analysis (PCA) and similarity analysis were performed for the eight tobacco samples. The results showed that the GC-IMS can detect 197 volatile aroma compounds in tobacco leaves and 75 of them are well identified. The fingerprint spectrum directly showed the difference in the composition/content of volatile aroma compounds in tobacco leaves from different producing areas. PCA and similarity analysis can clearly distinguish tobacco samples from different producing areas. This work demonstrated that the application of GC-IMS in analyzing the composition/content of aroma compounds in tobacco leaves is efficient. GC-IMS is a very powerful tool to give a direct and visual comparison of the composition/content of aroma compounds in tobacco leaves from different producing areas. The relationship between the composition/content of aroma compounds and producing areas could be established by this advanced technology. This work offers the possibility of planting or grading tobacco with different taste and smell more precisely in the future.


## 1. Introduction

As an industrial crop, tobacco is widely planted in more than 120 countries and regions in the world, which contributed too much to the local economy $[1-3]$. As the raw material of cigarettes, tobacco leaves contain very rich aroma compounds including alcohols, lipids, carbonyl groups, nitrogen heterocyclic groups, phenols, and acids, and many of these aroma compounds are closely related to the taste and smell of cigarettes [4-6]. For example, phenethyl alcohol endows the cigarette with the scent of flowers and acids can reduce the offensive smell of cigarette smoke. Therefore, identifying the composition/content of the aroma compounds in
tobacco leaves and the corresponding influence factor is very important. To date, studies focused on the effect of the maturation stage and stalk position on the aroma compounds' composition/content in tobacco leaves have been reported [7-9]. Since the climate and soil conditions of each producing area varies a lot, the impact of producing areas on the composition/content of these aroma compounds in tobacco leaves should be investigated carefully. Indeed, producing areas are an essential factor in the flavor of tobacco leaves [7, 10-13]. However, this kind of study is rare and not deep enough. Significantly, precisely detecting the composition/content of aroma compounds in tobacco leaves will offer basic data and will be further used, from the
molecular level, in the producing areas-flavor of tobacco leaves study. Undoubtedly, the study will be essential for planting and efficiently utilizing tobacco. To achieve this, advanced analytical equipment and technique are the prerequisites to comprehensively understand the relationship between producing areas and the taste/smell of cigarettes.

Till now, many analytical facilities which were extensively used in organic chemistry have been utilized to study the composition of aroma compounds in tobacco leaves. For instance, two-dimensional gas chromatography-time-offlight mass spectrometry ( $\mathrm{GC} \times \mathrm{GC}-\mathrm{TOF}-\mathrm{MS}$ ) combined with solvent extraction has been demonstrated to quickly and accurately determine free and bound aroma compounds in tobacco [14], Fourier transform near-infrared spectroscopy (FT-IR) combined with partial least squares regression can be effectively used to analyze the chemical components in tobacco [15, 16]. In addition, ultraperformance liquid chromatography (UPLC) [17, 18], ion chromatography (IC) [19], and nuclear magnetic resonance technology (NMR) [20,21] are also applied to the detection and identification of tobacco chemicals. Although these methods have their characteristics, there are still some limitations of the present analytical facilities and methods. For example, tedious sample preparation, long analysis time, costly, and sophisticated data analysis hindered their practical applications in aroma compounds' detection. Not only that, these traditional methods cannot offer a direct and visual comparison between tobacco samples, lacking analytical capacity. Hence, it is necessary to develop more powerful technologies to meet the requirement of detecting all aroma compounds in tobacco leaves effectively and precisely with a single testing equipment.

In recent years, a technology integrating the advantages of gas chromatography and ion mobility spectroscopy technology (GC-IMS) attracted our attention because of its high sensitivity, short analysis time, high selectivity, and no need for sample pretreatment detecting ability [22]. Especially, GC-IMS can perform orthogonal two-dimensional analysis. Due to these merits, this technology has been widely used in food detection [23], explosives detection [24], biomedical analysis [25], and environmental monitoring [26]. We assume that the composition/content of tobacco leaves will be effectively analyzed by this technology, resulting in a deep understanding of the relationship between the composition/content of aroma compounds and producing areas. Herein, as a proof-of-concept experiment, GC-IMS was applied to obtain a direct and visual comparison of the composition/content of aroma compounds in tobacco leaves from different producing areas. This kind of detailed comparison is very helpful to build a relationship between the composition/content of aroma compounds and producing areas, then to distinguish samples accurately and clearly from different production regions. More importantly, it is of significance for tobacco flavor control and tobacco leaves grade.

## 2. Materials and Methods

2.1. Analyzing Materials. The C3F grade tobaccos from QujingMalong, Yunnan province (YN-QJML-C3F), Chuxiong,

Yunnan province (YN-CHX-C3F), Zhaotong, Yunnan province (YN-ZHT-C3F), Guangyuan, Sichuan province (SCH-GY-C3F), Liangshanhuidong, Sichuan province (SCH-LSHHD-C3F), Liangshanhuili, Sichuan province (SCH-LSHHL-C3F), Zunyi, Guizhou province (GZH-ZY-C3F), and Qianxi'nan, Guizhou province (GZH-QXXN-C3F), were selected as testing materials.
2.2. Analytical Instruments and Methods. Flavour Spec GC-IMS was purchased from Gesellschaft für analytische Sensorsysteme mbH (Germany). Aroma compounds in tobacco samples from different regions were analyzed by GC-IMS in a positive ion mode. The GC-IMS was equipped with an automatic headspace sampler and a nonpolar chromatographic capillary column FS-SE-54-CB-0.5. The column length and internal diameter are 15 m and 0.53 mm , respectively. Initially, a certain amount of tobacco leave samples was randomly chosen from a place and ground into powder. Then, 1.0 g of the above-prepared tobacco powder was taken and placed in a sample inlet bottle ( 20 ml ) for further injection, which does not require the pretreatment of tobacco samples. After incubation at $80^{\circ} \mathrm{C}$ for $15 \mathrm{~min}, 500 \mu \mathrm{~L}$ of the headspace was automatically injected using a heated syringe $\left(80^{\circ} \mathrm{C}\right)$ into the heated injector $\left(85^{\circ} \mathrm{C}\right)$ of the GC-IMS equipment. The volatile compounds were separated through the GC column at $60^{\circ} \mathrm{C}$. The carrier gas $\left(\mathrm{N}_{2}\right.$, purity $\left.99.999 \%\right)$ is set at $0-2 \mathrm{~mL} / \mathrm{min}, 2 \mathrm{~mL} / \mathrm{min}, 2-10 \mathrm{~mL} / \mathrm{min}, 2-10 \mathrm{~mL} /$ $\min , 10-20 \mathrm{~mL} / \mathrm{min}, 20-25 \mathrm{~mL} / \mathrm{min}, 10-100 \mathrm{~mL} / \mathrm{min}$, and $100-150 \mathrm{~mL} / \mathrm{min}$ in succession. The drift tube was operated at a constant voltage of $400 \mathrm{~V} \mathrm{~cm}^{-1}$, a temperature of $45^{\circ} \mathrm{C}$, and the drift gas $\left(\mathrm{N}_{2}\right.$, purity $\left.99.999 \%\right)$ rate was set at $150 \mathrm{~mL} /$ min . The output data were collected in a special software tool that comes with the IMS instrument.

## 3. Results and Discussion

3.1. The Ion Mobility Spectrogram of the Tobacco Samples. Initially, the aroma compounds of the eight different tobacco samples were detected by carrying out GC-IMS analysis. As shown in Figure 1, a high density of reactive ion peak (RIP) points was marked in the coordinate system. The position of these peak points was determined by the retention time and drift time of the detected aroma compounds during the GC-IMS analysis. In the ion mobility spectrum, one peak point represents one aroma compound. In a selected tobacco sample, as high as 197 peak points could be counted. Moreover, the concentration of certain aroma compound was displayed by the colorized difference method. The red area indicated that the concentration of the aroma compound is high, the deeper the color, the higher concentration it had, and the blue area was the opposite. Based on this rule, the aroma compounds' distribution and concentration information in a tobacco sample were obtained visually. In addition, the difference among the eight tobacco samples can also be reflected through the direct comparison. By comparing the rectangular area in Figure 1, it was found that the difference in concentrations of some aroma compounds in tobacco is significant in different provinces. By comparing


Figure 1: The ion mobility spectrogram of the eight tobacco samples. The red area represents a high concentration of aroma compound; the deeper the color, the higher concentration it had, and the blue area was the opposite.
the circular area in Figure 1, obvious differences were also found that the concentrations of some aroma compound in tobacco samples from different cities in the same province.

### 3.2. Qualitative Analysis of Volatile Compounds in Tobacco.

 The qualitative analysis of aroma compounds in tobacco is the first step to understand the relationship between origins and tobacco taste. As discussed above, taking the YN-QJML-C3F as the reference sample, 197 peak points could be obtained in the ion mobility spectrum (Figure 2). In the figure, the $x$-axis represents drift time, the $y$-axis is the retention time. As is displayed, 75 of the peak points could be qualitatively analyzed, including alcohols, ketones, aldehydes, acids, lipids, furans, phenylalanine degradation products, and browning products. To be noted, some peak points correspond to the same compound because of the existence of monomers and dimers. This could be explained by the high content of the compound in the sample. The details of the identified volatile compounds are summarized in Table 1. In the table, the name of specific compounds and their corresponding peak positions in the ion mobility spectrum were revealed. The determination of the peak position and drift time of a certain compound can act as the reference and facilitate qualitative analysis of a tobacco leaf sample from an unknown producing area. Moreover, the odors of each compound are also clearly listed for reference [27]. These compounds presented different degrees of plant aroma. For example, some compounds presented pungent odors, and some presented tobacco odors, which are associated with the rich aroma compounds of tobacco. Aroma acids in tobacco can directly volatilize into smoke, which has a direct impact on taste and aroma compounds. Alcohol compounds in tobacco have a great influence on the quality of flue gas, such as benzyl alcohol and phenethyl alcohol,which can increase the fragrance of flowers in roasted tobacco [28, 29]. Carbonyl aroma compounds, including aldehydes, ketones, and quinones, have an important impact on the quality and flavor of tobacco [29]. Benzaldehyde can increase almond flavor in smoke, and 3-hydroxy-2-butanone can increase cream flavor in smoke. Lipid aroma compounds in tobacco also have important effects on aroma and taste. Amyl acetate can increase the banana smell in smoke, and ethyl valerate can increase the apple smell in smoke [30]. Overall, all of these aroma compounds together consist of the thick scent of the aroma of tobacco samples.
3.3. Fingerprint Analysis. Although a large number of aroma compounds were qualitatively identified and also their odor taste was clarified in the tobacco sample, it is still not easy to know how much contribution of each aroma compound to the whole flavor of tobacco leaves, which further led to some difficulties in the comparative analysis of the influence of producing areas. To investigate the content of certain aroma compounds more comprehensively in a tobacco sample, the gallery plot plug-in of LAV software developed by G. A. S. was used to select all the peaks in the ion mobility spectrum and automatically generate the fingerprint spectrum. The fingerprint spectrum enables easy and fast comparisons of different samples, differences in concentrations or presence/absence of marker peaks can be easily seen. The fingerprint spectrum of the sixteen batches of tobacco samples is shown in Figure 3, where the $X$-axis is the type of aroma compounds, and the $Y$-axis is the tobacco samples. In the $Y$-axis, two parallel samples from the same producing area were selected for the comparative analysis. In addition to the fingerprint spectrum, the specific data of the peak position and the area of identified compounds in the fingerprint spectrum were also revealed for the comparison


Figure 2: 75 marked peaks were qualitatively identified in the ion mobility spectrum of sample YN-QJML-C3F.
in Table S1. As shown in Figure 3, the similarity of the fingerprint spectrum of different batches of tobacco samples but the same producing area is high. This result verified that this analytic method is reproducible and reliable. For the tobacco samples from different producing areas, the variation in the content of aroma compounds is obvious. For instance, compounds 3-methylvaleric acid dimer, isoamyl acetate monomer, and 2-methylbutanol dimer are lower in samples SCH-GY-C3F with a peak area of $\approx 288$ and SCH-LSHHL-C3F with a peak area of $\approx 269$ in comparison to those from other places (peak area are more than 600). The sample YN-QJML-C3F showed a much higher content of ethyl 2-methylbutanoate and isoamyl acetate dimmer than other samples. Especially for the compound ethyl 2methylbutanoate (peak area: $\approx 880$ ), its highest content in the sample YN-QJML-C3F can act as an important indicator to distinguish it from other tobacco samples (most of their
peak area is below 150). Samples SCH-LSHHD-C3F and GZH-ZY-C3F have more similarities in aroma compounds even though they are from different provinces. Both of them have a higher content of the compound Z-3-hexen-1-ol than other tobacco samples, these two samples can be distinguished from other ones easily. To further distinguish samples SCH-LSHHL-C3F from GZH-ZY-C3F, carefully checking the content of ( $\mathrm{E}, \mathrm{Z}$ )-2, 6-nonadienal in these two samples is helpful. According to the fingerprint spectrum, the sample has a higher content of $(\mathrm{E}, \mathrm{Z})-2,6$-nonadienal is SCH-LSHHD-C3F with a peak area of $\approx 180$, the lower one is GZH-ZY-C3F with a peak area of $\approx 70$. To be noted, even in the tobacco samples from the same province but different countries or cities, a distinct difference in the concentrations of aroma compounds between these samples also existed. For example, samples from Yunnan Province YN-QJMLC3F, YN-ZHT-C3F, and YN-CHX-C3F, each have their own
TABLE 1: Qualitative analysis results of aroma compounds of the sample YN-QJML-C3F.

| Count | Compound | CAS\# | Rt (sec) | Dt (RIPrel) | Odor |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1-Hexanol | 111-27-3 | 370.84 | 1.3225 | Ethereal fusel oil fruity alcoholic sweet green |
| 2 | 1-Hydroxy-2-propanone | 116-09-6 | 176.879 | 1.2314 | Pungent sweet caramelly ethereal |
| 3 | 1-Pentanol dimer | 71-41-0 | 243.274 | 1.5114 | Fusel oil sweet balsam |
| 4 | 1-Pentanol monomer | 71-41-0 | 243.665 | 1.2525 | Fusel oil sweet balsam |
| 5 | 2, 3-Butandione | 431-03-8 | 134.977 | 1.1733 | Strong butter sweet creamy pungent caramel |
| 6 | 2, 3-Butanediol | 513-85-9 | 309.304 | 1.3672 | Fruity creamy buttery |
| 7 | 2-Acetylfuran | 1192-62-7 | 414.86 | 1.1162 | Sweet balsam almond cocoa caramel coffee |
| 8 | 2-Acetylpyridine | 1122-62-9 | 599.881 | 1.1209 | Popcorn heavy corn chip fatty tobacco |
| 9 | 2-Acetylpyrrole | 1072-83-9 | 719.975 | 1.1059 | Musty nut skin maraschino cherry coumarin licorice walnut bready |
| 10 | 2-Butanone | 78-93-3 | 142.74 | 1.2474 | Acetone-like ethereal fruity camphor |
| 11 | 2-Ethyl-1-hexanol | 104-76-7 | 663.231 | 1.4153 | Citrus fresh floral oily sweet |
| 12 | 2-Ethylfuran | 3208-16-0 | 185.481 | 1.3101 | Sweet burnt earthy malty |
| 13 | 2-Heptanol | 543-49-7 | 416.435 | 1.3732 | Fresh lemongrass herbal sweet floral-fruity green |
| 14 | 2-Hexenol dimer | 2305-21-7 | 331.76 | 1.5192 | Fruity green leafy |
| 15 | 2-Hexenol monomer | 2305-21-7 | 332.608 | 1.1815 | Fruity green leafy |
| 16 | 2-Methyl-1-propanol | 78-83-1 | 168.732 | 1.1712 | Ethereal winey cortex |
| 17 | 2-Methylbutanoic acid | 116-53-0 | 334.057 | 1.2096 | Pungent acid roquefort cheese |
| 18 | 2-Methylbutanol dimer | 137-32-6 | 216.955 | 1.4844 | Roasted wine onion fruity fusel alcoholic whiskey |
| 19 | 2-Methylbutanol monomer | 137-32-6 | 217.327 | 1.2376 | Roasted wine onion fruity fusel alcoholic whiskey |
| 20 | 2-Methyl-propanal dimer | 78-84-2 | 129.858 | 1.284 | Fresh aldehydic floral green |
| 21 | 2-Methyl-propanal monomer | 78-84-2 | 129.943 | 1.1036 | Fresh aldehydic floral green |
| 22 | 2-Octanol | 123-96-6 | 554.477 | 1.4418 | Fresh spicy green woody herbal earthy |
| 23 | 2-Pentanone | 107-87-9 | 170.77 | 1.3711 | Sweet fruity ethereal wine banana woody |
| 24 | 2-Pentylfuran | 3777-69-3 | 574.13 | 1.254 | Fruity green earthy beany vegetable metallic |
| 25 | 2-Phenylethanol | 1960/12/8 | 793.699 | 1.291 | Floral rose dried rose flower rose water |
| 26 | 3-Methylbutanal | 590-86-3 | 168.208 | 1.4102 | Ethereal aldehydic chocolate peach fatty |
| 27 | 3-Methylvaleric acid dimer | 105-43-1 | 498.284 | 1.6279 | Animal sharp acidic cheesy green fruity sweaty |
| 28 | 3-Methylvaleric acid monomer | 105-43-1 | 499.201 | 1.283 | Animal sharp acidic cheesy green fruity sweaty |
| 29 | 5-Methylfurfuryl alcohol | 3857-25-8 | 499.045 | 1.567 | Sweet caramellic |
| 30 | 6-Methyl-5-hepten-2-one | 110-93-0 | 566.203 | 1.1776 | Citrus green musty lemongrass apple |
| 31 | Acetoin | 513-86-0 | 201.386 | 1.3308 | Sweet buttery creamy dairy milky fatty |
| 32 | Acetone | 67-64-1 | 115.973 | 1.1182 | Solvent ethereal apple pear |
| 33 | Alpha-methylbenzenemethanol | 98-85-1 | 691.94 | 1.1933 | Fresh sweet acetophenone gardenia hyacinth |
| 34 | Alpha-terpieol | 10482-56-1 | 959.064 | 1.2856 | Lilac floral terpenic |
| 35 | Benzaldehyde dimer | 100-52-7 | 498.052 | 1.4695 | Strong sharp sweet bitter almond cherry |
| 36 | Benzaldehyde monomer | 100-52-7 | 498.052 | 1.1491 | Strong sharp sweet bitter almond cherry |
| 37 | Benzenemethanol | 100-51-6 | 662.63 | 1.3237 | Floral rose phenolic balsamic |
| 38 | Cyclohexanone | 108-94-1 | 331.597 | 1.4537 | Minty acetone |
| 39 | Dimethyl disulphide | 624-92-0 | 238.664 | 1.1472 | Sulfurous vegetable cabbage onion |
| 40 | E-2-hexen-1-ol | 928-95-0 | 324.795 | 1.1757 | Fresh green leafy fruity unripe banana |
| 41 | (E, Z)-2, 6-nonadienal | 557-48-2 | 874.685 | 1.3705 | Green fatty dry cucumber violet leaf |
| 42 | Ethyl-2-methylbutanoate | 7452-79-1 | 295.452 | 1.2425 | Sharp sweet green apple fruity |
| 43 | Ethyl acetate | 141-78-6 | 148.578 | 1.3374 | Ethereal fruity sweet weedy green |
| 44 | Ethyl butyrate | 105-54-4 | 297.065 | 1.5575 | Fruity juicy fruit pineapple cognac |

Table 1: Continued.

| Count | Compound | CAS\# | Rt (sec) | Dt (RIPrel) | Odor |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 45 | Ethyl pentanoate | 539-82-2 | 393.1 | 1.6844 | Sweet fruity apple pineapple green tropical |
| 46 | Ethyl propanoate | 105-37-3 | 194.587 | 1.1507 | Sweet fruity rum juicy fruit grape pineapple |
| 47 | Furfural dimer | 1998/1/1 | 305.714 | 1.3334 | Sweet woody almond fragrant baked bread |
| 48 | Furfural monomer | 1998/1/1 | 307.159 | 1.0829 | Sweet woody almond fragrant baked bread |
| 49 | Gamma-butyrolactone dimer | 96-48-0 | 423.483 | 1.3024 | Creamy oily fatty caramel |
| 50 | Gamma-butyrolactone monomer | 96-48-0 | 428.134 | 1.0823 | Creamy oily fatty caramel |
| 51 | Heptanal dimer | 111-71-7 | 399.962 | 1.6938 | Fresh aldehydic fatty green herbal wine-lee ozone |
| 52 | Heptanal monomer | 111-71-7 | 398.964 | 1.3305 | Fresh aldehydic fatty green herbal wine-lee ozone |
| 53 | Hexanal dimer | 66-25-1 | 270.35 | 1.5626 | Fresh green fatty aldehydic grass leafy fruity sweaty |
| 54 | Hexanal monomer | 66-25-1 | 270.613 | 1.2518 | Fresh green fatty aldehydic grass leafy fruity sweaty |
| 55 | Isoamyl acetate dimer | 123-92-2 | 364.495 | 1.7505 | Sweet fruity banana solvent |
| 56 | Isoamyl acetate monomer | 123-92-2 | 365.85 | 1.3075 | Sweet fruity banana solvent |
| 57 | Isopentanol | 123-51-3 | 239.511 | 1.1195 | Fusel oil alcoholic whiskey fruity banana |
| 58 | Linalool | 78-70-6 | 776.337 | 1.2204 | Citrus floral sweet bois de rose woody green blueberry |
| 59 | Methional | 3268-49-3 | 372.522 | 1.0868 | Musty potato tomato earthy vegetable creamy |
| 60 | Acetic acid, methyl ester | 79-20-9 | 122.656 | 1.1938 | Ether sweet fruity |
| 61 | Methyl-5-furfural | 620-02-0 | 512.507 | 1.1275 | Spice caramel maple |
| 62 | $n$-Nonanal dimer | 124-19-6 | 782.302 | 1.9402 | Waxy aldehydic rose fresh orris orange peel fatty peely |
| 63 | $n$-Nonanal monomer | 124-19-6 | 783.105 | 1.472 | Waxy aldehydic rose fresh orris orange peel fatty peely |
| 64 | Octanal | 124-13-0 | 600.438 | 1.4018 | Aldehydic waxy citrus orange peel green fatty |
| 65 | Pentanal dimer | 110-62-3 | 190.197 | 1.4247 | Fermented bready fruity nutty berry |
| 66 | Pentanal monomer | 110-62-3 | 190.413 | 1.1796 | Fermented bready fruity nutty berry |
| 67 | Pentanoic acid | 109-52-4 | 404.26 | 1.2271 | Sickening putrid acidic sweaty rancid |
| 68 | Phenylacetaldehyde dimer | 122-78-1 | 670.411 | 1.5386 | Green sweet floral hyacinth clover honey cocoa |
| 69 | Phenylacetaldehyde monomer | 122-78-1 | 668.193 | 1.2532 | Green sweet floral hyacinth clover honey cocoa |
| 70 | Phenylacetic acid | 103-82-2 | 1010.29 | 1.3311 | Sweet honey floral honeysuckle sour waxy civet |
| 71 | Propanal | 123-38-6 | 109.401 | 1.0436 | Earthy alcohol wine whiskey cocoa nutty |
| 72 | Propanoic acid | 1979/9/4 | 232.834 | 1.1038 | Pungent acidic cheesy vinegar |
| 73 | Propylsulfide | 111-47-7 | 376.951 | 1.1582 | Garlic onion |
| 74 | Toluene | 108-88-3 | 228.112 | 1.018 | Sweet |
| 75 | Z-3-hexen-1-ol | 928-96-1 | 340.959 | 1.5085 | Fresh green cut grass foliage vegetable herbal oily |

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Figure 3: The fingerprint spectrum of aroma compounds in the tobacco samples from eight producing areas.
characteristic aroma compounds. The same phenomenon was observed between samples GZH-ZY-C3F and GZH-QXXN-C3F from Guizhou province. Other compounds, such as 2-methylbutanoate acid, (E, Z)-2, 6-nonadienal, pentanal dimer, ethyl propanoate, 2, 3-butandiol, and isoamyl acetate dimer are various much among the samples from different producing areas. These results demonstrated the big influences of producing areas on aroma compound compositions in tobacco samples. The difference in the concentrations of different aroma compounds between producing areas are significant. Apart from the difference in the content of a certain compound in the tested samples, there are some compounds, such as $\gamma$-butyrolactone dimer, $\gamma$-butyrolactone monomer, acetoin, 2-methylbutanol monomer, methyl ester acetic acid, and acetone, are all rich in all tobacco samples. It means that the content of these compounds will not be affected by the producing areas, the intrinsic factor decides their content. As discussed above, the fingerprint analysis could help us to find out which tobacco sample has low or high concentrations of a certain aroma compound easily. Moreover, the fingerprint analysis can also be used to compare the concentrations of different aroma compounds in the same sample. Thus, the fingerprint spectrum and its related analysis is a very powerful tool to correlate the content of aroma compounds with the producing area.
3.4. Principal Component and Similarity Analysis. To further analyze the relationship among samples, principal component analysis (PCA) was conducted based on the information acquired for all volatile aroma compounds in tobacco samples. The results are shown in Figure 4, in which the contribution rate of the first principal component was $54 \%$. The contribution rate of the second principal component was $16 \%$, and the cumulative contribution rate of the two principal components reached $70 \%$. Judging from Figure 4, each sample from a different province had its characteristics, and the determination of the first and second principal components rate could be used to clearly distinguish eight tobacco samples from each other. The dispersion degree of tobacco samples was high in samples SCH-GY-C3F, SCH-LSHHD-C3F,


Figure 4: The principal component analysis of each sample.
SCH-LSHHL-C3F, GZH-ZY-C3F, and GZH-QXXN-C3F, but low in YN-QJML-C3F, YN-CHX-C3F, and YN-ZHT-C3F. The similarity between the two parallel samples in SCH-LSHHL-C3F was very high. Conversely, the two parallel samples in other cities had a certain difference, which could be caused by the tiny difference in soil constituents and temperature, and the variation of environmental humidity because of the long distance between the two cities.

To improve the accuracy of the analysis of tobacco samples from different producing areas, all volatile material information were used to calculate the similarity of each sample. Two parallel samples from the same producing area were also selected for the comparison. The results are shown in Table 2. Reasonably, the similarity between the two parallel tobacco samples is high, which achieved $96 \%$ at the lowest and $99 \%$ at the highest coinciding with the fingerprint spectrum analysis. For the tobacco samples YN-CHX-C3F and YN-ZHT-C3F, YN-CHX-C3F, and YN-QJML-C3F from the same province, their similarity was located between 90 and $92 \%$. However, the tobacco samples YN-ZHT-C3F and YN-QJML-C3F were relatively low ( $87-88 \%$ ), even though they are produced in the same province. To our surprise, most of the tobacco samples' similarity is low ( $72-89 \%$ ) in Sichuan province. The highest similarity value is only (88-89\%), which is obtained from samples SCH-LSHHL-C3F and SCH-GY-C3F. The same phenomenon
Table 2: The similarity between samples.

| Matching <br> (\%) | YN-QJML-C3F | YN-QJML-C3F | YN-CHX-C3F | YN-CHX-C3F | YN-ZHT-C3F | YN-ZHT-C3F | SCH-LSHHD-C3F | SCH-LSHHD-C3F | SCH-GY-C3F | SCH-GY-C3F | SCH-LSHHL-C3F | SCH-LSHHL-C3F | GZH-QXXN-C3F | GZH-QXXN-C3F | GZH-ZY-C3F | GZH-ZY-C3F |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| YN-QJML-C3F | 100 | 97 | 90 | 90 | 87 | 88 | 89 | 89 | 77 | 77 | 74 | 74 | 83 | 83 | 88 | 88 |
| YN-QJML-C3F | 97 | 100 | 90 | 90 | 87 | 88 | 89 | 89 | 79 | 79 | 77 | 76 | 85 | 85 | 89 | 88 |
| YN-CHX-C3F | 90 | 90 | 100 | 99 | 91 | 92 | 87 | 87 | 78 | 78 | 76 | 77 | 85 | 85 | 90 | 90 |
| YN-CHX-C3F | 90 | 90 | 99 | 100 | 91 | 92 | 87 | 87 | 78 | 78 | 76 | 77 | 85 | 86 | 90 | 89 |
| YN-Zht-C3F | 87 | 87 | 91 | 91 | 100 | 96 | 85 | 85 | 80 | 80 | 78 | 78 | 85 | 85 | 86 | 85 |
| YN-ZHT-C3F | 88 | 88 | 92 | 92 | 96 | 100 | 86 | 86 | 80 | 79 | 78 | 78 | 86 | 86 | 87 | 86 |
| SCH-LSHHD-C3F | 89 | 89 | 87 | 87 | 85 | 86 | 100 | 98 | 77 | 76 | 72 | 73 | 81 | 81 | 90 | 89 |
| SCH-LSHHD-C3F | 89 | 89 | 87 | 87 | 85 | 86 | 98 | 100 | 79 | 79 | 74 | 75 | 82 | 82 | 90 | 89 |
| SCH-GY-C3F | 77 | 79 | 78 | 78 | 80 | 80 | 77 | 79 | 100 | 99 | 88 | 88 | 86 | 86 | 77 | 77 |
| SCH-GY-C3F | 77 | 79 | 78 | 78 | 80 | 79 | 76 | 79 | 99 | 100 | 89 | 89 | 86 | 86 | 77 | 77 |
| SCH-LSHHL-C3F | 74 | 77 | 76 | 76 | 78 | 78 | 72 | 74 | 88 | 89 | 100 | 98 | 86 | 86 | 73 | 72 |
| SCH-LSHHL-C3F | 74 | 76 | 77 | 77 | 78 | 78 | 73 | 75 | 88 | 89 | 98 | 100 | 86 | 86 | 73 | 73 |
| GZH-QXXN-C3F | 83 | 85 | 85 | 85 | 85 | 86 | 81 | 82 | 86 | 86 | 86 | 86 | 100 | 98 | 82 | 82 |
| GZH-QXXN-C3F | 83 | 85 | 85 | 86 | 85 | 86 | 81 | 82 | 86 | 86 | 86 | 86 | 98 | 100 | 82 | 82 |
| GZH-ZY-C3F | 88 | 89 | 90 | 90 | 86 | 87 | 90 | 90 | 77 | 77 | 73 | 73 | 82 | 82 | 100 | 98 |
| GZH-ZY-C3F | 88 | 88 | 90 | 89 | 85 | 86 | 89 | 89 | 77 | 77 | 72 | 73 | 82 | 82 | 98 | 100 |

happened to samples GZH-QXXN-C3F and GZH-ZY-C3F from Guizhou province, resulting in a similarity of $82 \%$. By comparing and analyzing the similarity between tobacco samples from different regions. Interestingly, the similarity between tobacco samples GZH-ZY-C3F and YN-CHX-C3F, GZH-ZY-C3F, and SCH-LSHHD-C3F reached 90\%. This is not normal because the similarity between two tobacco samples from other regions was lower than $90 \%$. The high similarity between the two samples from different provinces may originate from the similar planting climate, soil condition, moisture, sunshine condition. All of the above discussion indicates that the aroma compounds in tobacco samples were greatly affected by the producing area.

## 4. Conclusion

In this study, GC-IMS technology was used for the qualitative analysis of aroma compounds in tobacco samples from eight different producing areas. Moreover, owing to the twodimensional analytic ability of this technology, the relationship between the composition/content of tobacco leaves and their producing areas was well-built. In tobacco leaves of this work, as high as 197 volatile aroma compounds were detected and 75 of them were well identified, including 23 alcohols, 20 aldehydes, 6 acids, 8 ketones, 9 lipids, and 3 furans. In addition to the qualitative analysis of the aroma compounds in a certain tobacco sample, the ion mobility spectrum and its corresponding fingerprint spectrum were successfully applied to directly reveal the content of the 75 identified compounds in the tobacco samples varying with producing areas. With these two advanced spectrums, the content of aroma compounds in the tobacco leaves is compared and discussed in detail in the light of different producing areas. This kind of comparison facilitates us to understand the impact of producing areas at the molecular level, bridging the gap between the macro tobaccoproducing areas and the micro aroma compounds composition/content. Furthermore, PCA and similarity analysis were used to distinguish samples accurately and clearly from different production regions, as well as to identify the origin of unknown samples. This work provides an example of the analysis of the composition/content of aroma compounds in tobacco leaves from different producing areas by GC-IMS for tobacco flavor control and tobacco leaves grade.

## Data Availability

The data used to support the findings of this study are included in Supplementary Materials.

## Conflicts of Interest

The authors declare that they have no conflicts of interest.

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## Supplementary Materials

The peak position and area of identified compounds in the fingerprint spectrum of tobacco samples from eight producing areas (Table S1) are included in Supplementary Materials. (Supplementary Materials)

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[^0]:     referred to the standard database of the Perflavory information system.

