

# Analytical Methods

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# Analysis of volatile organic compounds from Chinese vinegar substrate during solid-state fermentation using colorimetric sensor array

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## Abstract

Aroma is a significant index to reflect the quality of vinegar. This paper intends to investigate the volatile organic compounds (VOCs) of vinegar's substrate during solid-state fermentation. Gas chromatography and mass spectrometry (GC-MS), as well as colorimetric sensor array, was used comparatively to characterize the VOCs in the different stages of acetic acid fermentation. The chemical components of ethanol, 3-Methyl-1-butanol, acetic acid and ethyl acetate obtained from GC-MS were remarkably changed during solid-state fermentation. What's more, the technique of colorimetric sensor array was also used to characterize the VOCs of solid-state fermentation. The color changes of colorimetric sensor array before and after exposure to the vinegar's substrate samples were obtained by a Charge Coupled Device (CCD) camera. The digital data (i.e. RGB components of the image) representing the color change profiles for the vinegar samples were analyzed. Principle components analysis (PCA) was employed to present the trend of fermentation process through analyzing the signals obtained from colorimetric sensor array. Linear discriminant analysis (LDA) model based on PCA scores was used to distinguish vinegar's substrate samples per day during the whole process of fermentation. The result shows that, round to 60 per cent samples were correctly identified corresponding to their fermenting day. And 92.3 per cent samples were correctly identified with the error range of 3 days. The technique of colorimetric

28 sensor array was considered as an excellent method for VOCs measurement based on  
29 its advantages of non pretreatment requirement, fast, and costless.

30 **Key words:** volatile organic compounds (VOCs), colorimetric sensor array, pattern  
31 recognition, solid-state fermentation, substrate of vinegar;

## 32 1. Introduction

33 Vinegar is a famous traditional condiment with long history in China,<sup>1</sup> and the  
34 brewing technology is an important part of Chinese traditional culture. ‘Zhenjiang’  
35 aromatic vinegar, as one of the most famous vinegars in China,<sup>2</sup> is produced by  
36 solid-state delaminating fermentation. A large number of studies showed that vinegar  
37 not only could be used as acid seasoning, but it is beneficial for health such as<sup>3</sup>  
38 preventing the colds,<sup>4</sup> treating the gastropathy,<sup>5</sup> keeping the tumors at bay and so on.  
39 What’s more, with the improvement of people’s living standard,<sup>6</sup> the requirement for  
40 the quality of vinegar is increasingly higher. However, the process of solid-state  
41 fermentation is built on manual operation, and the quality control of vinegar mostly  
42 relies on experience identification. In this case, the quality of the products is easily  
43 affected by the changing environment, which leads to a great variety of products of  
44 diverse quality.

45 Aroma is an essential index of vinegar quality;<sup>7</sup> aromatic components evaluation  
46 plays an important role in the identification and quality control of vinegar.<sup>8</sup> At present,  
47 sensory evaluation and chemical analysis are most used in analyzing vinegar quality.  
48 However, sensory evaluation is limited due to the subjectivity of human sense and  
49 pungency of acetic acid. Chemical analysis is time consuming, reagents demanding,  
50 costly, and cannot be assessed with the whole information.

51 Though the traditional electronic nose can characterize the odor of food and  
52 agro-products comprehensively, quickly and objectively<sup>9</sup>, it is sensitive  
53 to temperature and humidity in the environment.<sup>10</sup> In addition, the acetic acid in  
54 vinegar can make the sensors of traditional electronic nose “poisoning”.<sup>11</sup> Olfactory  
55 visualization is a normal electronic nose system which is based on the colorimetric

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2  
3 56 sensor array.<sup>12-14</sup> Compared with the customary electronic nose technology,  
4  
5 57 colorimetric sensor array has a stronger recognition ability, higher precision, wider  
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7 58 range and<sup>15</sup> free of ambient humidity effect and more intuitive and vivid. Some  
8  
9 59 relevant studies reported that colorimetric sensor array was used to<sup>16</sup> determine  
10  
11 60 alcohol,<sup>17</sup> acetate and chloride,<sup>18</sup> hydrogen sulfide and<sup>19</sup> aldehydes.

12  
13 61 This paper intends to investigate the volatile organic compounds (VOCs) of  
14  
15 62 vinegar's substrate during solid-state fermentation. Gas chromatography and mass  
16  
17 63 spectrometry (GC-MS), as well as colorimetric sensor array, was used comparatively  
18  
19 64 to characterize the VOCs in the different stages of acetic acid fermentation. Principle  
20  
21 65 components analysis combined with linear discrimination analysis were employed to  
22  
23 66 present the trend of fermentation process through analyzing the signals obtained from  
24  
25 67 colorimetric sensor array. Further more, effective colorimetric materials which were  
26  
27 68 potential for characterization of solid-state fermentation would be selected.

## 29 **2. Materials and methods**

### 30 **2.1. Acetic acid solid-state fermentation process and sample preparation**

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33 70  
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35  
36 71 The solid-state fermentation substrate of vinegar samples were obtained from  
37  
38 72 'Hengshun' brand, Jiangsu province Zhenjiang city.<sup>20</sup> 'Zhenjiang' aromatic vinegar,  
39  
40 73 produced from solid-state fermentation methods of acetification, is a sticky  
41  
42 74 rice-derived product of high reputation, much appreciated by the custom of China and  
43  
44 75 Southeast Asian countries. The solid-state delaminating fermentation process of  
45  
46 76 'Hengshun' vinegar takes about 19 days.

47  
48 77 Acetic acid fermentation process is a metabolic process that converts ethanol to  
49  
50 78 acids; depend mainly on the effect of acetic acid bacteria fermentation to ethanol  
51  
52 79 oxidation into acetic acid process. In the solid-state fermentation, that is also a process  
53  
54 80 to broaden the active region of acetic bacteria. In conventional solid-state  
55  
56 81 fermentation, the process is divided into five stages, which is also a process to  
57  
58 82 broaden the active region of acetic bacteria, as shown in Fig.1. The green dots in the

1  
2  
3 83 figure represent the distribution of acetic acid bacteria. Along with the fermentation,  
4  
5 84 the acetic acid bacteria's density increased and the acetic acid bacteria's range  
6  
7 85 expanded. On the first day of fermentation, fermented substrate of vinegar inoculated  
8  
9 86 on the surface of fresh substrate; this process is named inoculation. The second and  
10  
11 87 the third days are called heat extraction process: the rice hulls were paved on the  
12  
13 88 surface of the substrate and then well-mixed. The rice hull can increase the contact  
14  
15 89 area of the substrate and oxygen, which ensured the growth and metabolism of  
16  
17 90 aerobic microbial in the substrate. During this time, upper acetic acid bacteria  
18  
19 91 reproduced quickly. The third stage of the process lasted about 5 days; it mainly  
20  
21 92 requires turning over the fermenting substrate layer by layer, expanding the solid-state  
22  
23 93 fermentation substrate. The fourth stage of the process was turning over the  
24  
25 94 fermenting substrate till the bottom of ponds, which aimed to provide enough oxygen  
26  
27 95 and avoid overheating of the local substrate. After about 19 days, the substrate  
28  
29 96 matured.

30  
31 97 [Figure 1 about here]

32  
33  
34 98 The solid fermentation substrates of vinegar were sampled every day in the whole  
35  
36 99 process (2012.12.19-2013.1.7). All samples were kept at a temperature around 0 °C  
37  
38 100 before the trial and a daily detection was performed in order to avoid interruptions by  
39  
40 101 storage time.

## 41 42 102 **2.2. SPME-GC/MS analyses**

43  
44  
45 103 Analyses were performed on gas chromatograph-mass spectrometer HP6890-5973  
46  
47 104 (Agilent, USA) with a nonpolar column (30 m×0.25 mm ID×0.25 μm film).The  
48  
49 105 initial temperature was 35 °C, the column was heated to 100 °C at a rate of 5 °C /min,  
50  
51 106 and then heated at a rate of 3 °C /min and 10 °C /min to 200 °C and 220 °C respectively,  
52  
53 107 and held at 220 °C for 15 min. The inlet temperature and ion source temperature were  
54  
55 108 230 °C and 220 °C. Mass spectra were obtained at an electron impact potential of 70  
56  
57 109 eV with a range of 30–500 amu. The data were processed through the

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3  
4 110 HP-Chemstation System workstation. In this work, the selection of fibers, the  
5  
6 111 extraction time and the extraction temperature were optimized previously. The  
7  
8 112 optimal SPME methodology conditions were as follows. The optimal fiber was 75  $\mu\text{m}$   
9  
10 113 Carboxen–PDMS (CAR–PDMS), the extraction time was 40 min and the extraction  
11  
12 114 temperature was 40 °C.

13  
14 115 The solid fermentation substrate of vinegar at 5 stages were detected by GC-MS.  
15  
16 116 Five stages were inoculation (first day), heat extraction (2nd day), scoop (7th day),  
17  
18 117 grinning (9th day) and maturing (19th day), the experiments were repeated three times.  
19  
20 118 3.0 g samples and 2.5 g solid sodium chloride were placed in 15 mL extraction flask  
21  
22 119 in a 40 °C thermostatic water bath. SPME fiber collected the volatiles of samples.  
23  
24 120 After 40 mins, the extracted head was inserted into the injection port of the GC-MS  
25  
26 121 and desorpted for 3min at 250 °C.

### 27 122 **2.3. Artificial olfaction system**

28  
29  
30 123 The portable artificial olfaction system aimed at detecting the smell of liquid such  
31  
32 124 as wine and vinegar was developed by our laboratory. It was used to characterize and  
33  
34 125 discriminate the odor of solid fermentation substrate of vinegar in the fermentation  
35  
36 126 process. A schematic diagram of the system is presented in Fig.2. This artificial  
37  
38 127 olfaction system includes gas volatile system, gas detection system, power system and  
39  
40 128 control system. Images of the sensor array were captured by a CCD camera  
41  
42 129 (CMLN-13S2M/C, Sony, Japan). The parameter of Gamma was set at 1.26; and  
43  
44 130 exposure time was 0.38 s.

45  
46 131 [Figure 2 about here]

### 47 48 49 132 **2.4. Colorimetric sensor array analyses**

50  
51  
52 133 According to our pre-experiment, 10g solid fermentation substrate of vinegar was  
53  
54 134 put in gas collecting chamber, and the colorimetric sensor array was placed inside the  
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56 135 reaction chamber. The camera recorded the image of the sensor array before it  
57  
58 136 exposed to the gas. 15mins later, the vacuum pump was turned on, and the volatile gas  
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1  
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3 137 was put into reaction chamber by vacuum pump. The color change of colorimetric  
4  
5 138 sensor was recorded by CCD camera immediately. Sampling interval is alterable  
6  
7 139 under the intervention of the computer, and the minimum time of sampling interval in  
8  
9 140 the artificial olfaction system is 2 second (which means the system collects the images  
10  
11 141 every 2 seconds at the fastest), hence the changes of colorimetric sensor array  
12  
13 142 could be monitored in real time. Since each sensor array contains 15 colorimetric dyes  
14  
15 143 (nine metalloporphyrins materials and six pH indicators), which printed on a silica gel  
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17 144 plates, the response signal of each dye in an array could be expressed by the red (R),  
18  
19 145 green (G), and blue (B) values, which resulted in 45 variables (15 dyes  $\times$  3 color  
20  
21 146 components, RGB). All variables were utilized in statistical and quantitative analyses  
22  
23 147 and subsequent pattern recognition. The whole device was arranged in the chamber of  
24  
25 148 constant temperature about 25 °C.

## 26 27 149 **2.5. Multivariate statistical analysis**

28  
29  
30 150 Multivariate analysis methods play a key role in characterizing the odor of  
31  
32 151 vinegar's solid fermentation substrate based on the colorimetric sensor array. All  
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34 152 algorithms were implemented in Matlab R2010a (Mathworks, USA) under Windows  
35  
36 153 XP.

## 37 38 39 154 **3. Results and discussion**

### 40 41 42 155 **3.1 Fermentation temperature**

43  
44  
45 156 Fermentation temperature is an important factor during the vinegar production. The  
46  
47 157 temperature of solid fermentation substrates of vinegar is raised by the reproduction  
48  
49 158 and metabolic of acetic acid bacteria. If the environment is suitable for breeding, the  
50  
51 159 acetic acid bacteria will reproduce actively and have a high rate of metabolism.<sup>21</sup> The  
52  
53 160 raw materials present in a solid-state during the fermentation process, which makes  
54  
55 161 the heat consumption difficult and causes overheating. The overheating of solid  
56  
57 162 fermentation substrates brings the poor quality of vinegar. Hence, the fermentation

1  
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3 163 temperature needs to be controlled in the process of traditional solid-state  
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5 164 fermentation.

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7 165 The experiment was performed at December and January, the environmental  
8  
9 166 temperature was ranged from 4~11 °C. The temperatures of acetic acid fermentation  
10  
11 167 were monitored to ensure the acetic acid fermentation process performed normally.  
12  
13 168 The temperature of acetic acid fermentation is showed in [Table 1](#).The optimum  
14  
15 169 temperature of acetic acid bacteria is 38 °C <sup>22</sup>. In general, the fermentation  
16  
17 170 temperature could not be over 45 °C, and the fermentation substrates were turned over  
18  
19 171 before the temperature reached 45 °C.

20  
21 172 As we can see from [Table 1](#), in the inoculation process, the initial temperature of  
22  
23 173 the acetic acid fermentation is low because of the limited metabolic heat from the less  
24  
25 174 quantity of acetic acid bacteria. The rice hulls were mixed with solid fermentation  
26  
27 175 substrates of vinegar in heat extraction process; this increased the oxygen and the  
28  
29 176 contact area with raw materials. With the rapid reproduction of acetic acid bacteria,  
30  
31 177 the temperature raised rapidly from 26 °C to 44 °C during the heat extraction process.  
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33 178 In scoop process, the solid-state fermentation substrate was expanded by turning over,  
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35 179 acetic acid bacteria still reproduced actively and the temperature was maintained at 40  
36  
37 180 °C. During the grinning process, the substrates which were necessary for acetic acid  
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39 181 bacteria reduced, then the temperature gradually declined till the fermented substrate  
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41 182 matured.

42 [Table 1 about here]

43  
44  
45 184 ***3.2 GC - MS detection of solid fermentation substrates of vinegar at different***  
46  
47 185 ***fermentation stages***

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49  
50 186 Aroma components of solid fermentation substrates of vinegar at different  
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52 187 fermentation stages were detected by GC-MS, the result is listed in [Table 2](#). As shown  
53  
54 188 in [Table 2](#), the contents of lipids such as ethyl acetate, isoamyl acetate and ethyl  
55  
56 189 palmitate generally increased at the beginning and then decreased. At the same time,  
57  
58 190 the result shows that the alcohols declined along with the fermentation and the acids



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4 191 increased slowly at initial stage, along with the fermentation, then it increased quickly.  
5 192 <sup>20</sup> The acetone transferred to propanol in later stage, reducing its content. As a result of  
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7 193 Maillard reaction, Strecker degradation and bacterial autolysis, tetramethylpyrazine, 2,  
8  
9 194 4-Di-tert-butylphenol and other aromatic compounds were generated in the later stage  
10  
11 195 of the fermentation <sup>23</sup>.

12  
13  
14 [Table 2 about here]

15  
16  
17 197 In could be concluded from Table 2, the chemical components of ethanol,  
18  
19 198 3-Methyl-1-butanol, acetic acid and ethyl acetate remarkably changed during  
20  
21 199 solid-state fermentation. Content changes of ethanol, 3-Methyl-1-butanol, acetic acid  
22  
23 200 and ethyl acetate are representative; the results are shown in Fig.3. The acetic acid  
24  
25 201 fermentation is a process oxidizing alcohol to acetic acid by acetic acid bacterium. As  
26  
27 202 a result, the contents of ethanol and 3-Methyl-1-butanol gradually reduced. Acetic  
28  
29 203 acid increased slowly in the initial stage of fermentation while increased sharply in the  
30  
31 204 later stage of fermentation. This can be explained by the reason that the acetic acid  
32  
33 205 bacteria were not the dominant bacteria in the initial stage of fermentation, and a part  
34  
35 206 of generated acid had an esterification with the ethanol. Later, thanks to the breeding  
36  
37 207 of a large number of acetic acid bacteria, acetic acid content raised sharply.

38  
39 208 The content of the ethyl acetate achieved maximum in about 7 days, then began to  
40  
41 209 decline. Due to pre-glycosylated, liquefaction and alcohol fermentation process, the  
42  
43 210 content of ethyl acetate was high at inoculation stage. A large amount of acid  
44  
45 211 generated along with the acetic acid fermentation, meanwhile, the daily “turn over”  
46  
47 212 helped the underlying ethanol esterificated with acetic acid and generated ethyl  
48  
49 213 acetate. The continuing increase of ethyl acetate content reached its maximum value  
50  
51 214 after a week. At the last stage, the content of the ethyl acetate declined, as we inferred,  
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53 215 was volatilized with “turn over”.

54 [Figure 3 about here]

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56  
57 217 **3.3 Sensor responses optimization**  
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3 218 The sampling interval of the CCD camera was set as 1min, and the reaction time  
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5 219 was 24min. Fig.4 shows the difference maps of sensor array exposed to the solid  
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7 220 fermentation substrate at different reaction time. <sup>24</sup>This implied changes in the nature  
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9 221 of volatiles emitted over time, some sensor returned to their baseline values. As can be  
10  
11 222 seen from the Fig.4, the difference maps were changing all the time from 2 min to 20  
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13 223 min. When the reaction time reached 20 min, the reaction reached equilibrium with  
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15 224 the sensor array and the difference map tended to be stable. Therefore, the reaction  
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17 225 time was set at 20 min finally.

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19  
20 226 [Figure 4 about here]

### 21 22 23 227 *3.4 PCA analysis*

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25  
26 228 The data of colorimetric sensor variables containing overlapped information which  
27  
28 229 bring great difficulty in the research. Principal components analysis (PCA) makes it  
29  
30 230 possible to extract useful information from original data, and to present the trend of  
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32 231 solid-state fermentation process with an intuitive way.

33  
34 232 [Figure 5 about here]

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36  
37 233 Fig.5a shows a 2-dimensional (2D) space of all vinegar samples in fermentation  
38  
39 234 represented by PC1, PC2. Geometrical exploration based on PCA score plots shows  
40  
41 235 the clusters trend in the 2-dimension space. In Fig.5a, clusters of most vinegar  
42  
43 236 samples continued spreading with fermentation time increased. The vinegar samples  
44  
45 237 belong to heat extraction (1-2d) and maturing stage of fermentation (17-19d) could be  
46  
47 238 separated directly by PCA. However, the separation of other samples was not clear,  
48  
49 239 and especially some overlapped could be observed from vinegar samples of scoop and  
50  
51 240 grinning stage. This can be explained by continuous and uneven characteristic of  
52  
53 241 solid-state fermentation. Fig.5b shows a 2-dimensional (2D) space of vinegar samples  
54  
55 242 in a certain day of each stage of fermentation (1st, 2nd, 7th, 9th, 19th day,  
56  
57 243 respectively). In this figure, the clusters trend of vinegar samples is clearer. It could be  
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3 244 concluded that there are inherent compositional differences among the VOCs of  
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5 245 vinegar samples during fermentation process.  
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7 246 In order to further investigate characterization of samples using colorimetric sensor  
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9 247 array, the algorithm of LDA is employed to discriminate vinegar samples with  
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11 248 different days of fermentation. PCA scores were used as vectors inputted into the  
12  
13 249 LDA classifiers as latent variables.  
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15  
16 250 ***3.5 Characterization of solid fermentation substrate based on the colorimetric***  
17  
18 251 ***sensor array***  
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20  
21 252 Solid-state fermentation of Zhenjiang vinegar is a process of poly-bacteria  
22  
23 253 fermentation. Not only does it generate the acetic acid from the raw materials through  
24  
25 254 acetic acid bacteria but it also turns the protein, fat from the raw materials into  
26  
27 255 flavoring substances. Besides, the autolytic activities of bacteria generate a variety of  
28  
29 256 flavor substances. Different fermentation stages produce substances differently.  
30

31 257 [Figure 6 about here]  
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34 258 The results of colorimetric sensor array reflect the color changes on all sensors.  
35  
36 259 This technology transferred olfactory information to visual information and made the  
37  
38 260 odor "visible". Fig.6 shows the difference maps of solid fermentation substrate of  
39  
40 261 vinegar at different fermentation stages. Compared to traditional electronic nose,  
41  
42 262 colorimetric sensor array is more visualized and vivid. As it shown in this figure,  
43  
44 263 during the reaction process, some changes were becoming more and more evident (the  
45  
46 264 colors were getting brighter in the fig.), that is, the VOCs which reacted with these  
47  
48 265 sensors had gained their contents. At the same time, changes in some sensors were  
49  
50 266 getting smaller (the colors were getting bleaker in the fig.), which means, contents of  
51  
52 267 some VOCs were reducing. In addition, colors of some sensors were turning brighter  
53  
54 268 first and bleaker later. These changes actually coordinated with the aroma components  
55  
56 269 changes analyzed by GC-MS. However,<sup>25</sup> aroma components measured by GC-MS  
57  
58 270 were the molecular components, which were difficult to be consistent with VOCs  
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3 271 messages obtained by human. Nevertheless, <sup>26-27</sup> the colorimetric sensor array could  
4  
5 272 express the complete information of target substance.  
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7

8 273 [Figure 7 about here]  
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10  
11 274 The color changes of bromocresol green (a) and neutral red (b) during 19 days are  
12  
13 275 shown in Fig.7. Bromocresol Green is a pH indicator, which was sensitive to acid <sup>28-29</sup>.  
14  
15 276 Our tests indicate that the response value of bromocresol green which is exposed to  
16  
17 277 acid is 4-8 times as large as other chemically responsive dyes. The color changes from  
18  
19 278 the figure demonstrate acetic acid bacteria were not the dominant bacteria from the  
20  
21 279 2nd day to the 9th day; meanwhile, the limited generated acetic acid mainly reacted  
22  
23 280 with alcohols (i.e. esterification). Therefore, changes of bromocresol green were not  
24  
25 281 obvious during the pre-fermentation. Thereafter, acetic acid bacterium gradually  
26  
27 282 became took the dominance that they generated amounts of acetic acid. Hence why,  
28  
29 283 the changes of sensor were particularly evident in the latter period. Neutral red was  
30  
31 284 sensitive to alcohol. As we can see from Fig.7(b), the color changes decreased at heat  
32  
33 285 extraction stage, because of the alcohol consume by acetic acid bacteria; then the  
34  
35 286 color became brighter, this is because that the operation of “turn over”, which bring  
36  
37 287 the alcohol from the bottom to the top. After the stage of grinning, there was no  
38  
39 288 alcohol supply, so the content of alcohol became less, which presents bleaker colors in  
40  
41 289 the figure. To conclude, it is possible to have a real-time monitor on the vinegar  
42  
43 290 fermentation when establishing an aroma data base for acetic acid solid-state  
44  
45 291 fermentation based on colorimetric sensor array technique.

#### 46 292 *3.4 Sensor responses* 47 48

49 293 The algorithm of LDA was employed to discriminate vinegar samples with  
50  
51 294 different days of fermentation. By maximizing the ratio of the inter-class distance to  
52  
53 295 the intra-class distance, LDA aims to find a linear transformation to achieve the  
54  
55 296 maximum class discrimination, <sup>30</sup> such that the feature clusters are most separable  
56  
57 297 after the transformation which can be achieved through scatter matrix analysis. By  
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3 298 means of searching for a group of basis vectors, which make different class samples,  
4  
5 299 have the largest between-class distance and the smallest within-class distance, and  
6  
7 300 contemporaneously to get optimal transformation in classical LDA.  
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10 [Table 3 about here]  
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12  
13 302 The results of LDA model to identify the fermented substrate of vinegar from  
14  
15 303 different days can be seen from Table 3, the principal components number is 15. Table  
16  
17 304 3 shows the recognition rate of every day and provides the sources of errors. The  
18  
19 305 result shows that, round to 60 per cent samples were correctly identified  
20  
21 306 corresponding to their fermenting day. And 92.3 per cent samples were correctly  
22  
23 307 identified with the error range of 3 days. This is because the continuity and  
24  
25 308 inhomogeneity of solid-state fermentation has made the classification process difficult.  
26  
27 309 Although there were some wrong classifications, the colorimetric sensor array still  
28  
29 310 showed good characterization capability, for the error sources were mostly in the close  
30  
31 311 days.  
32

### 33 **Conclusions** 34

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36  
37 313 A portable artificial olfaction system based on colorimetric sensor array was  
38  
39 314 developed to characterize the flavor of vinegar's solid fermentation substrate in  
40  
41 315 different fermentation stages. The colorimetric sensor array was made from nine  
42  
43 316 metalloporphyrins materials and six pH indicators printed on a silica gel plates. The  
44  
45 317 color changes of colorimetric sensor array before and after exposure to the vinegar's  
46  
47 318 substrate samples were obtained by a CCD camera. The response data was analyzed  
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49 319 with PCA and LDA models which showed good characterization skills. At the same  
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51 320 time, aroma components of substrates of vinegar at different fermentation stages were  
52  
53 321 detected by GC-MS. This work has demonstrated the potential of colorimetric sensor  
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55 322 array, which was not only convenient for detection but also characterized the overall  
56  
57 323 aroma information of vinegar's solid fermentation substrate during acetic acid  
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59 324 fermentation process.  
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3 325 Therefore, colorimetric sensor array provides an effective and convenient platform  
4  
5 326 for real-time monitoring during the vinegar fermentation process.  
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9  
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18  
19 332 discussion in this field.  
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21

### 22 333 **Compliance with Ethics Requirements**

23  
24  
25  
26 334 No conflict of interest exists in the submission of this manuscript, and manuscript is  
27  
28 335 approved by all authors for publication. I would like to declare on behalf of my  
29  
30 336 co-authors that the work described was original research that has not been published  
31  
32 337 previously, and not under consideration for publication elsewhere, in whole or in part.  
33

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385 **Figure captions**

386 Fig.1 Acetic acid fermentation process diagram

387 Fig.2 The diagram of artificial olfaction system

388 Fig.3 Content changes of Ethanol, 3-Methyl-1-butanol, Acetic acid and Ethyl acetate  
389 (%)

390 Fig.4 The response value of sensor at different reaction time

391 Fig.5 Classification result achieved by PCA (a) 5 stages (b) 5 days

392 Fig.6 Classification the substrate of vinegar in different fermentation stages by  
393 colorimetric sensor array

394 Fig. 7 The color changes of bromcresol green (a) and neutral red (b) during 19 days

395 **Table captions**

396 Table 1 The change of temperature through the acetic acid fermentation

397 Table 2 Aroma components of substrate of vinegar in different fermentation stages  
398 (%)

399 Table 3 Results of LDA model to identify the different days of fermented substrate of  
400 vinegar

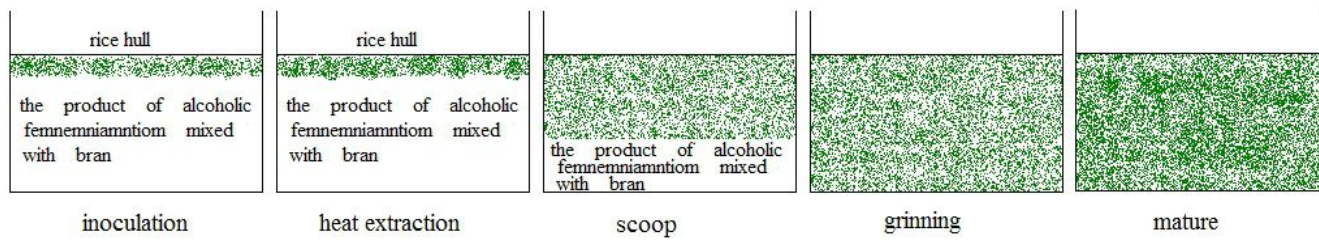
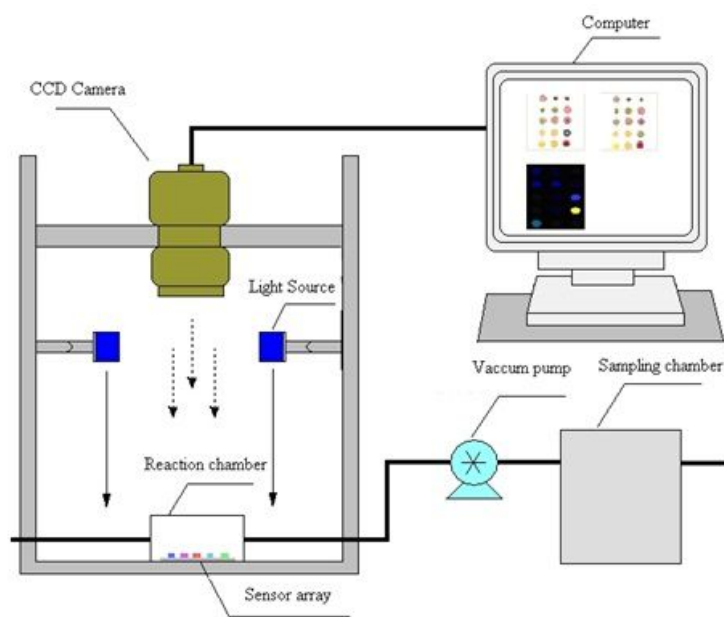
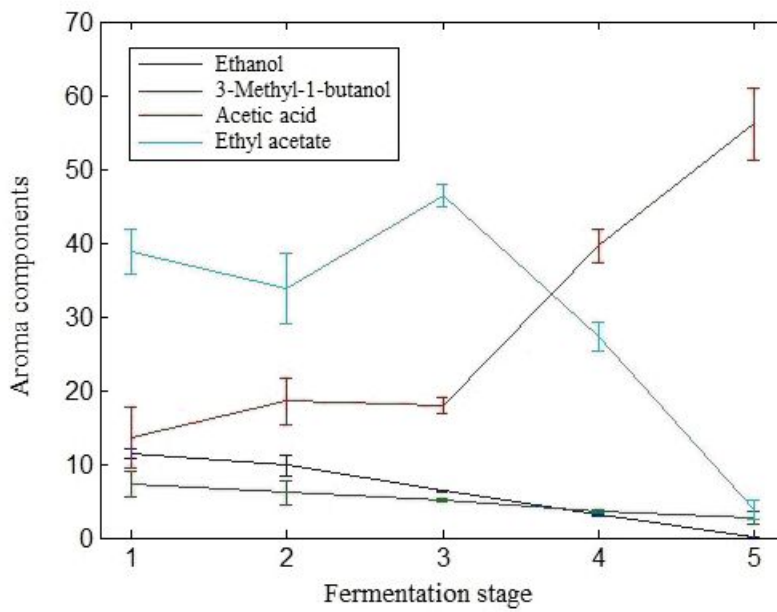


Fig.1 Acetic acid fermentation process diagram

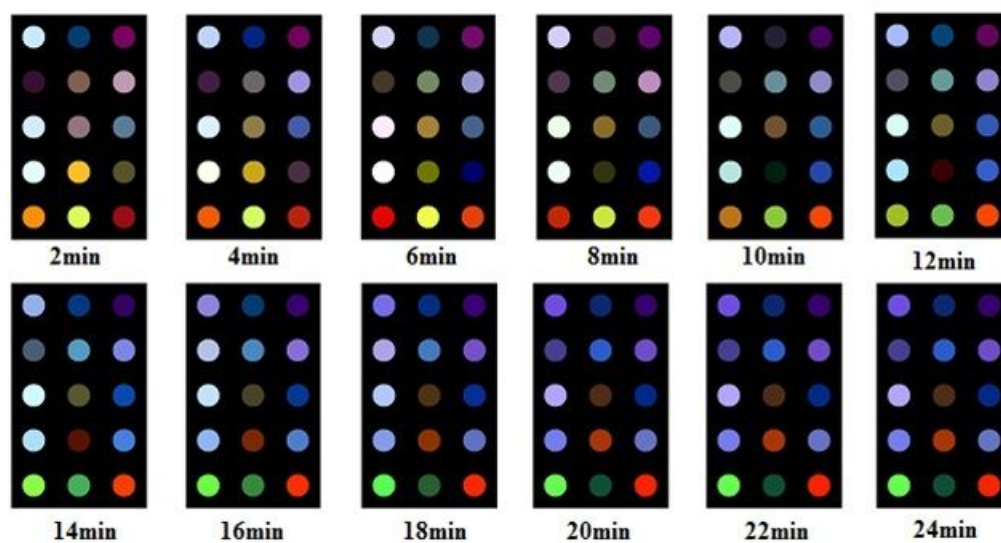


**Fig.2** The diagram of artificial olfaction system

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**Fig.3** Content changes of Ethanol, 3-Methyl-1-butanol, Acetic acid and Ethyl acetate (%)



**Fig.4** The response value of sensor at different reaction time

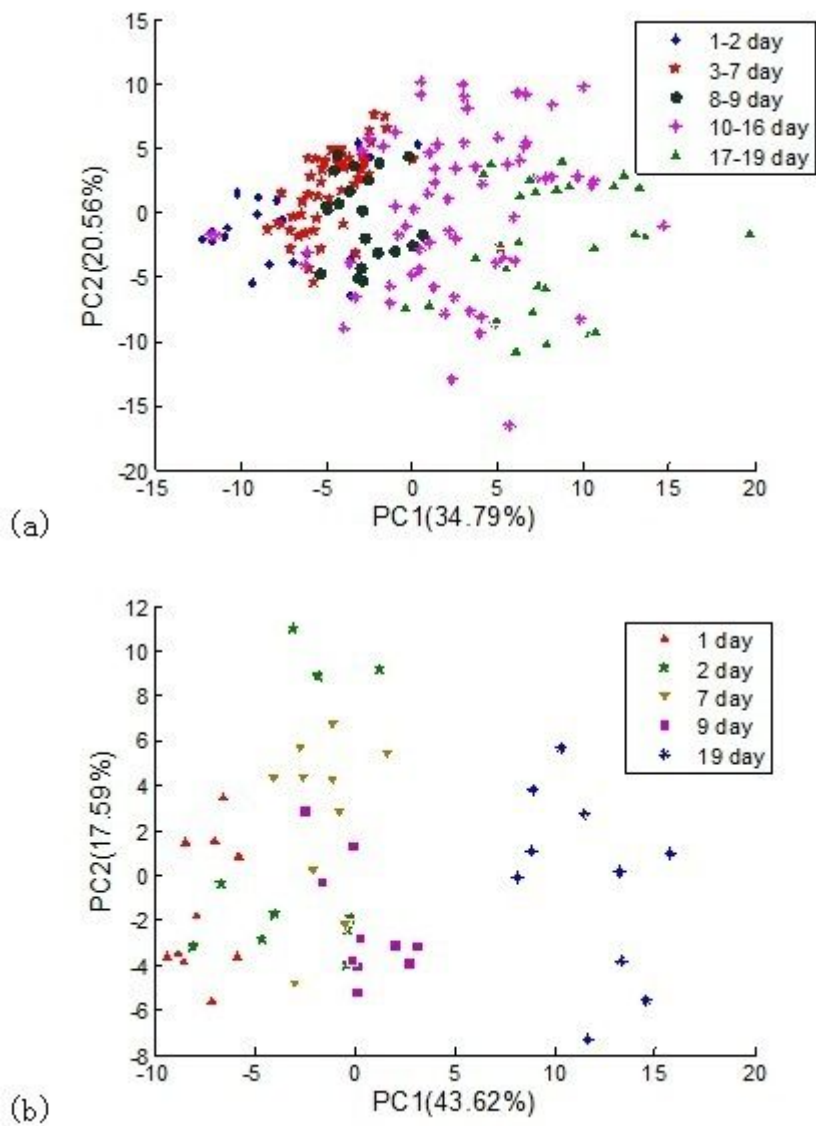
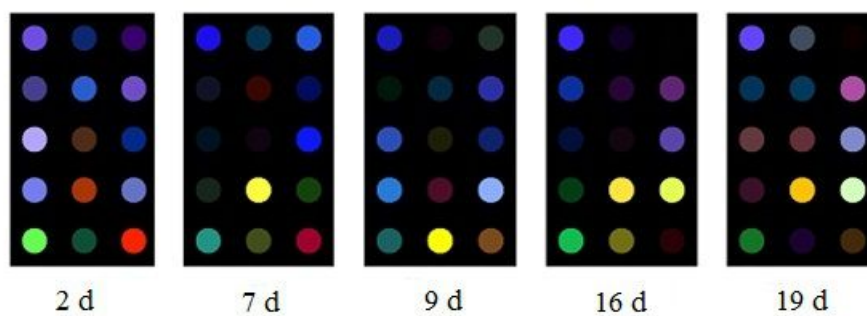


Fig.5 Classification result achieved by PCA (a) 5 stages (b) 5 days

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**Fig.6** Classification the substrate of vinegar in different fermentation stages by colorimetric sensor array

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Fig. 7 The color changes of bromocresol green (a) and neutral red (b) during 19 days

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**Table 1** The change of temperature through the acetic acid fermentation

Days	mean temperature <sup>a</sup>	maximum temperature	minimum temperature
1	26.16±0.81	28.30	21.00
2	38.85±6.01	45.70	28.30
3	44.43±0.36	44.90	41.80
4	39.02±1.02	41.90	37.00
5	41.74±3.74	48.10	36.40
6	40.50±2.50	44.30	34.60
7	36.01±1.50	38.50	33.20
8	41.34±1.82	44.50	34.80
9	42.25±2.79	47.30	38.60
10	39.31±2.41	43.40	33.70
11	38.69±1.94	41.70	35.10
12	36.99±1.28	39.00	33.80
13	36.01±1.83	38.50	32.00
14	32.27±0.14	32.40	31.90
15	31.90±0.96	32.90	29.10
16	30.26±0.56	30.80	28.00
17	25.03±1.79	29.10	21.50
18	25.58±1.41	28.50	23.60
19	22.70±0.34	23.60	20.70

<sup>a</sup> mean ± std

**Table 2** Aroma components of substrate of vinegar in different fermentation stages (%)

	compounds	inoculation	heat extraction	scoop	grinning	mature
	<b><i>Etanol</i></b>	<b><i>11.44±0.70<sup>a</sup></i></b>	<b><i>9.87±1.41<sup>b</sup></i></b>	<b><i>6.36±0.14<sup>c</sup></i></b>	<b><i>3.07±0.14<sup>d</sup></i></b>	<b><i>0.1±0<sup>e</sup></i></b>
	2-Methyl-1-propanol	0.59±0.09	0.52±0.10	0.41±0.02	0.25±0.02	0.17±0.08
	Trimethyl-Silanol					0.77±0.52
	2-Methyl-1-butanol		1.14±0.01			0.89±0.63
	(S)-(-)-2-Methyl-1-butanol	1.75±0				
	<b><i>3-Methyl-1-butanol</i></b>	<b><i>7.21±1.72<sup>a</sup></i></b>	<b><i>6.15±1.60<sup>ab</sup></i></b>	<b><i>5.05±0.26<sup>bc</sup></i></b>	<b><i>3.59±0.25<sup>cd</sup></i></b>	<b><i>2.75±0.86<sup>d</sup></i></b>
alcohols	1-Pentanol	0.15±0.04	0.14±0.01	0.08±0.01	0.04±0	
	Hexyl alcohol	0.53±0.14	0.54±0.06	0.29±0.01	0.18±0.02	
	Diisobutylcarbinol	0.93±0.21	0.81±0		0.41±0.07	0.36±0.19
	2,3-Butanediol	0.24±0.23	0.19±0.17	0.1±0.01	0.51±0.12	0.39±0.12
	(R,R)-2,3-Butanediol					0.65±0.55
	Phenethyl alcohol	2.60±0.41	2.46±0.23	1.64±0.09	2.36±0.12	2.18±1.72
	Acetic acid,2-(trimethylsilyl)-					0.39±0.30
	<b><i>Acetic acid</i></b>	<b><i>13.59±4.16<sup>a</sup></i></b>	<b><i>18.48±3.23<sup>a</sup></i></b>	<b><i>17.97±1.10<sup>a</sup></i></b>	<b><i>39.61±2.22<sup>b</sup></i></b>	<b><i>56.12±4.84<sup>c</sup></i></b>
acids	Isobutyric acid	0.2±0.04	0.25±0.06	0.18±0.03	0.25±0.03	0.55±0.10
	Isovaleric acid	0.72±0.13	0.7±0.13	0.57±0.04	0.81±0.13	1.54±0.61
	Valeric acid					0.09±0
	Hexanoic acid		0.09±0.08	0.05±0	0.12±0.05	0.41±0.30
	<b><i>Ethyl acetate</i></b>	<b><i>38.85±3.07<sup>a</sup></i></b>	<b><i>33.77±4.82<sup>a</sup></i></b>	<b><i>46.43±1.56<sup>b</sup></i></b>	<b><i>27.28±1.96<sup>c</sup></i></b>	<b><i>3.84±1.25<sup>d</sup></i></b>
	Isobutyl acetate	0.92±0.16	0.79±0.13	1.19±0.10	0.51±0.11	0.55±0.06
	Isoamyl acetate	5.57±1.08	4.27±1.28	5.54±0.58	3.41±0.61	2.22±0.70
	Ethyl caproate	0.73±0	0.85±0	0.45±0	0.56±0	0.29±0
	Hexyl acetate	0.06±0.01	0.08±0.05	0.07±0.01	0.09±0.02	0.04±0.01
	Ethyl heptanoate		0.06±0.01	0.05±0	0.05±0.03	0.02±0
	Ethyl lactate	2.27±0.75	1.05±0.09	1.84±0.04	2.00±0.05	1.19±0.52
esters	Ethyl caprylate	0.30±0.12	0.46±0.09	0.58±0.12	0.85±0.17	0.19±0
	Ethyl nonanoate	0.07±0	0.08±0.03	0.10±0.03	0.16±0	0.04±0
	Ethyl caprate	0.08±0.04	0.08±0.03	0.18±0.04	0.26±0.03	0.07±0
	Diethyl succinate	0.71±0.16	0.56±0.22	0.46±0.02	0.45±0.03	0.37±0.29
	Ethyl phenylacetate	0.12±0.01	0.13±0.04	0.07±0.01	0.06±0.01	0.07±0.05
	Phenethyl acetate	1.22±0.07	0.9±0.13	1.07±0.01	1.60±0.17	1.53±1.01
	gamma-Nonanolactone					0.07±0.06
	Ethyl palmitate	0.19±0.04	0.19±0.04	0.34±0.04	0.30±0.02	0.13±0.04
	Acetaldehyde				0.12±0.03	0.09±0.02
	Isovaleraldehyde					0.09±0.06
aldehydes	Hexanal			0.01±0		0.02±0
	3-Furaldehyde		0.07±0	0.05±0		
	Furfural	0.21±0.04	0.17±0.02	0.15±0	0.40±0.08	1.61±1.86

	Benzaldehyde	0.76±0.26	1.15±0.08	0.37±0.11	0.26±0.03	0.16±0.12
ketone	Acetone	1.3±0.44	1.84±0.94	0.90±0.20	0.71±0.09	0.28±0.14
compounds	2,3-Butanedione	1.10±0.18	1.59±0.11	1.12±0.08	1.31±0.08	1.41±1.17
	3-Hydroxy-2-butanone	3.51±1.16	6.68±1.70	3.50±0.28	5.58±0.34	10.1±1.08
	Hydroxybenzene					0.03±0.02
phenols	2,6-Di-tert-butylphenol	0.14±0				
	2,4-Di-tert-butylphenol					0.62±0.49
	Hexamethylcyclotrisiloxane	0.08±0.01	0.07±0.01	0.08±0.01	0.07±0.02	0.08±0.03
	Dimethyl disulfide					0.03±0.01
Other	Decamethylcyclopentasiloxane	0.27±0.11	0.37±0.05	0.23±0.03	0.16±0.01	0.14±0
	Tetramethylpyrazine	0.04±0				0.17±0.16
organic	2(2-Ethoxyethoxy)ethanol	0.07±0.01	0.08±0			0.1±0.08
	Azulene		0.04±0		0.03±0	
	Hexamethylcyclotrisiloxane					0.16±0.02
	1-Methylnaphthalene		0.06±0.01	0.05±0	0.04±0.01	

P: Values in the same row followed by different letters (a-e) differ significantly at a  $p < 0.05$  level.

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**Table 3** Results of LDA model to identify the different days of fermented substrate of vinegar

Days	Recognition rate	Error sources						
1	10/10							
2	7/10	2→1	2→3	<b>2→12</b>				
3	7/10	3→5	3→6	3→6				
4	9/10	4→5						
5	6/10	5→3	5→3	5→3				
6	5/10	6→3	6→5	6→7	<b>6→12</b>	<b>6→12</b>		
7	7/10	<b>7→1</b>	7→4	7→8				
8	5/10	8→6	8→7	8→7	8→9	8→9		
9	6/10	9→8	9→11	9→12	9→12			
10	5/10	<b>10→3</b>	10→8	10→9	10→11	10→12		
11	8/10	11→12	<b>11→16</b>					
12	7/10	12→9	12→13	12→14				
13	3/10	<b>13→9</b>	13→11	13→14	13→15	13→16	<b>13→17</b>	<b>13→19</b>
14	5/10	<b>14→2</b>	14→11	14→13	14→13	14→15		
15	4/10	<b>15→11</b>	15→16	15→17	15→17	15→18	<b>15→19</b>	
16	5/10	16→13	16→13	16→15	16→17	16→17		
17	6/10	17→15	17→16	17→18	17→19			
18	5/10	18→15	18→15	18→17	18→19	18→19		
19	4/10	<b>19→13</b>	<b>19→15</b>	19→17	19→18	19→18	19→18	
Total	114/190							