

1 **Running title:** Identification of coumarin-enriched Japanese green teas using E-nose

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3 **Title: Identification of coumarin-enriched Japanese green teas and their particular flavors**
4 **using electronic nose**

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14

15 **Abstract**

16 Conventionally, tea flavor is analyzed through the use of a combination of gas
17 chromatography-mass spectrometry and human taste panel. These methods present
18 time-consuming or inaccurate factor. In this work, a rapid, accurate and nondestructive
19 approach was put forward to identify coumarin-enriched Japanese green teas and evaluate their
20 particular flavors using electronic nose (E-nose) technique. The multivariable analyses
21 including principal components analysis and cluster analysis were applied to distinguish the tea
22 samples and evaluate the particular (coumarin-like) flavor of coumarin-enriched tea under

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1 different infusion conditions. The correct classification was achieved for the seven tea samples
2 with different content of coumarin. The E-nose successfully characterized the drying
3 temperature-dependently trend of coumarin content during the manufacture process of
4 coumarin-enriched green tea. It also revealed that the comparatively low-infusion temperature
5 and long-infusion time were favorable for the emission of coumarin-like flavor of the tea
6 infusion. In addition, a comparatively newly developed “absolute value expression” (AVE)
7 analysis was employed to divide the tea flavors into quality and express them numerically.
8 Using AVE, the role of coumarin in the total flavor of coumarin-enriched green tea was
9 elucidated. These results suggest that E-nose could be employed to identify the green teas with
10 particular flavor and evaluate the tea flavor.

11 **Keywords:** Electronic nose; Green tea; Coumarin; Flavor; Tea infusion

12

13 **Introduction**

14 Green tea is the most popular beverage in Japan. This high acceptability is due to many
15 factors, and one of the most important reasons is its characteristic flavor. The conventional
16 evaluation of tea flavor is performed through the use of a combination of gas
17 chromatography-mass spectrometry (GC-MS) and human taste panel. Although GC-MS is an
18 efficient chromatographic technique for identification of odors in plant or food extracts, it also
19 presents a time-consuming factor. The sensory profiling by human taste panel is affected by
20 external factors and usually inaccurate because of a lack of either sensitivity or quantitative
21 information ([Dutta et al., 2003a](#)). Aroma extract dilution analysis technique is also a useful
22 approach to determine the potency of odors in tea ([Kumazawa and Masuda, 2002](#)), but it
23 requires the combination with the GC analysis and GC-olfactometry technique. Recently,

1 electronic nose (E-nose) instruments, which mimic the olfactory receptor in human nose, have
2 been developed that allow highly sensitive, increasingly fast, reliable odor analyses and hence
3 represent promising tools for continuous real time monitoring of odors of food and beverage.

4 E-nose devices have been successfully applied to different fields particularly in food and
5 beverage industries, such as snake fruit ([Supriyadi et al., 2004](#)), tomato ([Hernández Gómez et
6 al., 2008](#)), and coffee ([Falasconi et al., 2005](#)). E-noses have also been used for identification
7 of tea grade ([Yu et al., 2008](#)), prediction of tea quality ([Dutta et al., 2003b](#)), and monitoring of
8 black tea fermentation process ([Bhattacharyya et al., 2007](#)). However, little information is
9 available regarding the application of E-nose in identification of teas with particular flavor and
10 evaluation of tea flavor.

11 In our previous study, several Japanese green teas were found to have particular
12 sweet-herbaceous fragrance by the sensory evaluation ([Yang et al., 2008](#)). Furthermore,
13 application of GC-MS for volatile analysis revealed that these green teas with sweet-herbaceous
14 odor contained comparatively high content of coumarin, a character impact compound for the
15 sweet odor quality of Japanese green tea, so called “coumarin-enriched” Japanese green tea”
16 ([Yang et al., 2008](#)). The objective of this study is to investigate whether it is possible to
17 develop a rapid, accurate, and nondestructive E-nose-based approach to distinguish the Japanese
18 green teas with different content of coumarin and evaluate the role of coumarin in the flavor of
19 coumarin-enriched green tea.

20

21 **Materials and methods**

22

23 *Tea sample*

1 The seven Japanese green tea products (the first crop, 2007) including “Shizu-7132”,
2 “Koushun”, “Kanayamidori”, “Yabukita”, “Macikuo”, “Okunosawa”, and “Okumidori” were
3 purchased from the market in Japan. GC-MS analysis showed that the concentrations of
4 coumarin in common green tea products were generally below 0.2 µg/g, whereas
5 “Shizu-7132” and “Koushun” contained 0.88 and 0.67 µg/g coumarin respectively, so called
6 coumarin-enriched green teas (Yang et al., 2008).

7 The previous study also indicated that coumarin content was drying temperature-dependently
8 reduced during the manufacturing process of coumarin-enriched Japanese green tea
9 “Shizu-7132” (Yang et al., 2008). To investigate the discriminating ability of E-nose for
10 different manufacture processes of tea sample, sampling from different drying temperature (50
11 °C, 60 °C, 70 °C, and 80 °C) was carried out for E-nose analysis.

12 *Sample preparation for E-nose analysis*

13 Tea sample equivalent to 1 g of dry tea product was infused with 50 ml fresh boiled deionized
14 water for 3 min and filtered using the tea filter paper (Daiso Industries, Ltd., Japan). The
15 filtrate was immediately cooled to about 25 °C in trap water. 3 mL of the tea infusion was
16 injected into a special gas bag (2 L, FF-1, 2KF, Shimadzu, Japan) used for odor analysis, and
17 then filled with the nitrogen. To stabilize the concentration of odors in the headspace of the bag,
18 the gas bag with tea infusion and nitrogen was kept for 2 h at room temperature in dark and then
19 analyzed by the E-nose.

20 To select the optimum infusion conditions of the coumarin-enriched green tea (Shizu-7132)
21 for the particular (coumarin-like) flavor, a mixed level design was conducted using a
22 two-variable and three-level (infusion time: 40 s, 160 s and 280 s; infusing temperature: 60 °C,
23 75 °C and 90 °C) based on SAS software (Ver. 8.0, SAS, Inc). The flavors of nine treatments

1 were compared with that of the tea sample blended with coumarin (1 ppm) by E-nose analysis.

2 *E-nose and measuring condition*

3 The E-nose device (FF-2A Fragrance & Flavor Analyzer, Shimadzu, Japan) was equipped with
4 an array of 10 different oxide semiconductor sensors, trap tube and CPU (**Fig. 1A**). The
5 headspace tea aroma was pumped into the sensor chamber for 60 sec at a flow rate of 165 ml/min,
6 and analyzed by the sensors within two measuring modes (**Fig. 1B**). Combination of the two
7 measuring modes can reflect the more characters of the sampling odors. Using the trap tube,
8 the sensitivity, reproducibility and distinctiveness of measurement are increased because of the
9 concentration of sampling odor and the removal of humidity in sampling odor.

10 *Pattern recognition of E-nose*

11 Multivariate analyses including principal components analysis (PCA) and cluster analysis (CA)
12 were applied to distinguish the tea samples and evaluate the particular (coumarin-like) flavor of
13 the coumarin-enriched tea under different infusion conditions. All the calculations were
14 performed by SPSS software (Ver. 14.0, SPSS, Japan Inc.).

15 A comparatively newly developed “absolute value expression (AVE)” controlled by ASmell2
16 software (Ver. 1.09, Shimadzu, Japan) was employed to divide the tea aroma into quality and
17 express them numerically. As shown in **Fig. 2**, the concept of vector is introduced into the
18 representation of odor. The direction of vector presents the quality of odor. The similarity
19 indices to standard odors are put forward to express the quality of odor numerically.

20

21 **Results and discussion**

22

23 *E-nose response to tea aroma and feature extraction for the classification analysis*

1 As shown in **Fig. 3**, when estimating the sensor response to a given tea sample (Shizu-7132),
2 the response values were used as $R = -\log(R_x / R_b)$, where R was the response, R_b the baseline
3 resistance of a sensor (without sampling odor), and R_x was the measured resistance of a sensor
4 with sampling odor. Both measuring modes (**Fig. 1B**) showed different characteristics. The
5 trap tube can remove the humidity in the aroma of tea fusion and concentrate the sampling aroma.
6 Consequently, the signals of some sensors in the measuring mode with trap tube appear to be
7 stronger than that without trap tube. This may imply that the humidity in the sampling odor can
8 affect the measurement of the sensors. Although some applications of E-nose to the teas have
9 been reported, none is involved in the effect of sample humidity on the sensor analysis. To
10 characterize the sampling tea aroma, combination of the responses of sensors within both
11 measuring modes was used in this work.

12 Feature extraction of sensor response is of great importance, which requires the conversion of
13 sample features to patterns that have condensed representations, ideally containing only salient
14 information (**Yu et al., 2008**). In this work, the maximum values of the response of each sensor
15 within the two measuring modes were extracted for the latter classification analysis (PCA and
16 CA).

17 *Identification of coumarin-enriched green teas and optimization on the tea infusion conditions*
18 *for the coumarin-like flavor using PCA and CA*

19 The number of data per sample was 20 (maximum values of the responses of 10 sensors within
20 the two measuring modes). PCA was employed to reduce the dimensionality and visualization
21 of datasets while retaining as much as possible of the variation present in the original dataset.
22 In this work, the dimensionality of the datasets obtained by the E-nose was reduced to three
23 dimensions due to the score of the first three-component (PC1, PC2, and PC3). The

1 three-dimension scatter plot of PCA for the seven tea samples is shown in **Fig. 4A**. It can be
2 found that the cumulative reliabilities of PC1, PC2, and PC3 are 95.754%, which appear to
3 provide the enough information for the best discrimination of the teas. **Fig. 4A** reveals that the
4 seven tea samples were well-separated. Additionally, the coumarin-enriched green teas
5 (Shizu-7132 and Koushun) were clearly distinguished from the green tea group with less
6 coumarin. CA was also employed to examine the sensorial data (maximum values of sensor
7 response) and to test the relationships of various tea groups. In the present study, the
8 measurement of similarity is based on the pearson correlation and the cluster method is the
9 between-groups linkage. The position of the line on the scale indicates the distance at which
10 clusters are joined. The observed distances are rescaled to fall into the range of 1 to 25 by
11 SPSS software (**Fig. 4B, 5B, and 6B**). The ratio of the rescaled distances within the
12 dendrogram is the same as the ratio of the original distances. **Fig. 4B** shows that the cluster
13 including coumarin-enriched green teas (Shizu-7132 and Koushun) was obtained, which is in
14 good accordance with the PCA result. It is generally accepted that E-noses are capable of
15 distinguishing the different kinds of tea samples because of the high sensitivity. The results
16 presented here imply that E-nose also possessed the ability of classification of the tea flavor.
17 **Fig. 5** reveals the drying temperature-dependently trend of coumarin content in
18 coumarin-enriched green tea (Shizu-7132), suggesting that E-nose can be employed as a tool for
19 monitoring the characteristic aroma during the manufacture process of tea.

20 It is well known that the flavors of tea infusions vary with the infusing temperature and time.
21 To evaluate the coumarin-like flavor of coumarin-enriched tea under different infusion
22 conditions, we also compared the E-nose response signals of tea aroma under the 9 different
23 infusion conditions with that of the tea sample blended with coumarin (1 ppm) using PCA and

1 CA. **Fig. 6** reveals that the response signals of E-nose for the tea infused with 60 °C water for
2 280 s and the treatment with coumarin are much closer. This indicates that the comparatively
3 low-infusion temperature and long-infusion time were favorable for the emission of
4 coumarin-like flavor of tea infusion.

5 *Evaluation of the role of coumarin in the total flavor of coumarin-enriched green tea*

6 Although coumarin-enriched green teas contain comparatively high content of coumarin, it
7 remains to be determined for the role of coumain in the total tea flavor. In this study, the AVE
8 method was employed to express the quality of tea aroma numerically (**Fig. 2**). The
9 coumarin-enriched green teas (Shizu-7132 and Koushun) and green tea with less coumarin
10 (Yabukita) were defined as the standard odors. The standard mode was accomplished by
11 ASmell2 analysis software (Ver. 1.09, Shimadzu, Japan). As shown in **Fig. 7**, the similarity
12 index of the total flavor of Yabukita to that of Shizu-7132 and Koushun increased after the
13 treatment with coumarin equivalent to the content in Shizu-7132 and Koushun. This suggests
14 that coumarin plays an important role in the total flavor of coumarin-enriched green teas.

15

16 **Conclusion**

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18 GC-MS has been extensively applied to the studies on tea flavor. However, GC-MS requires
19 the further extraction with organic solvents for separating the odorant from nonvolatile matrix
20 compounds. The present study confirmed the merits of E-nose in respect to sensitivity and
21 accuracy. Once more, the simple and fast sample preparation without the organic solvents
22 points to the superiority of the E-nose. Using E-nose, the identification results of
23 coumarin-enriched green teas were satisfied (**Fig. 4**). E-nose was also suitable for monitoring

1 the characteristic aroma during the tea manufacture process (Fig. 5) and evaluating the particular
2 flavors under the different infusion conditions (Fig. 6). The numerical expression of the odors
3 was introduced into E-nose (Fig. 7), making it more applicable for the evaluation of tea flavor.
4 The highly sensitive, ultrafast, and specific techniques would be desirable to evaluate the flavors
5 in food, which will effectively improve the quality control of food and beverage.

6

7 **Abbreviations**

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9 AVE, absolute value expression; CA, cluster analysis; E-nose, electronic nose; GC-MS, gas
10 chromatography-mass spectrometry; PCA, principal components analysis.

11

12 **Acknowledgements**

13

14 This work was supported by a research grant from the Kyoto Tea Academy. We are
15 grateful to Dr. Baldermann, S. at Shizuoka University in Japan for the valuable discussions.

16

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1 **Legends to figures:**

2

3 **Figure 1 The schematic diagram of electronic nose (FF-2A Fragrance & Flavor Analyzer,**
4 **Shimadzu, Japan) (A), and its measuring conditions (B).**

5 (A) The E-nose (FF2A) is equipped with 10 different oxide semiconductor sensors
6 positioned in a chamber. FF2A system consists of a sampling apparatus, trap tube, a detector
7 unit containing the array of sensors, and computer program (CPU and PC) for data recording and
8 analysis. The headspace tea aroma was pumped into the sensor chamber and the response value
9 of each sensor changed. The measurement procedure was controlled by the computer program.

10 (B) The sampling tea aroma was pumped straightforwardly to the sensor chamber not *via* trap
11 tube and measured by the sensors (Measuring mode I). The sampling tea aroma was conducted
12 to the trap tube for the removal of the humidity (Drying purge), concentrated by the trap tube,
13 and then measured by the sensors (Measuring mode II).

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16 **Figure 2 Principle of absolute value expression (AVE) controlled by ASmell2 software (Ver.**
17 **1.09, Shimadzu, Japan).**

18 The response signals of 10 sensors were represented by vector of 10 dimensions. The direction
19 of the vector shows the quality of odor. The similarity index between sampling odor and
20 standard odor is expressed by the angle between their vectors.

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23 **Figure 3 Response curves of 10 sensors (ch1, ch2, ..., ch10) within two measuring modes to**

1 **the aroma of the green tea (Shizu-7132) infusion**

2 The odors in the headspace of gas bag was pumped into the E-nose for 60 s, and analyzed by 10
3 sensors within two measuring modes. Measuring time of the sensors in each mode was 120 s.

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6 **Figure 4 PCA (A) and CA (B) for E-nose response to the aroma of the Japanese green tea**
7 **infusions.**

8 Analytical results are based on the maximum values of the response of each sensor within the two
9 measuring modes.

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12 **Figure 5 PCA (A) and CA (B) for E-nose response to the aroma of sampling from different**
13 **drying temperature (50 °C, 60 °C, 70 °C, and 80 °C) during the manufacturing process of**
14 **coumarin-enriched green tea (Shizu-7132).**

15 Analytical results are based on the maximum values of the response of each sensor within the two
16 measuring modes.

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19 **Figure 6 PCA (A) and CA (B) for E-nose response to the aroma of the coumarin-enriched**
20 **green tea (Shizu-7132) under the different infusing conditions.**

21 Analytical results are based on the maximum values of the response of each sensor within the two
22 measuring modes.

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2 **Figure 7 Comparison of similarity indices to coumain-rich or weak green teas as standards**
3 **between the tea sample (Yabukita) and its treatment with coumarin.**

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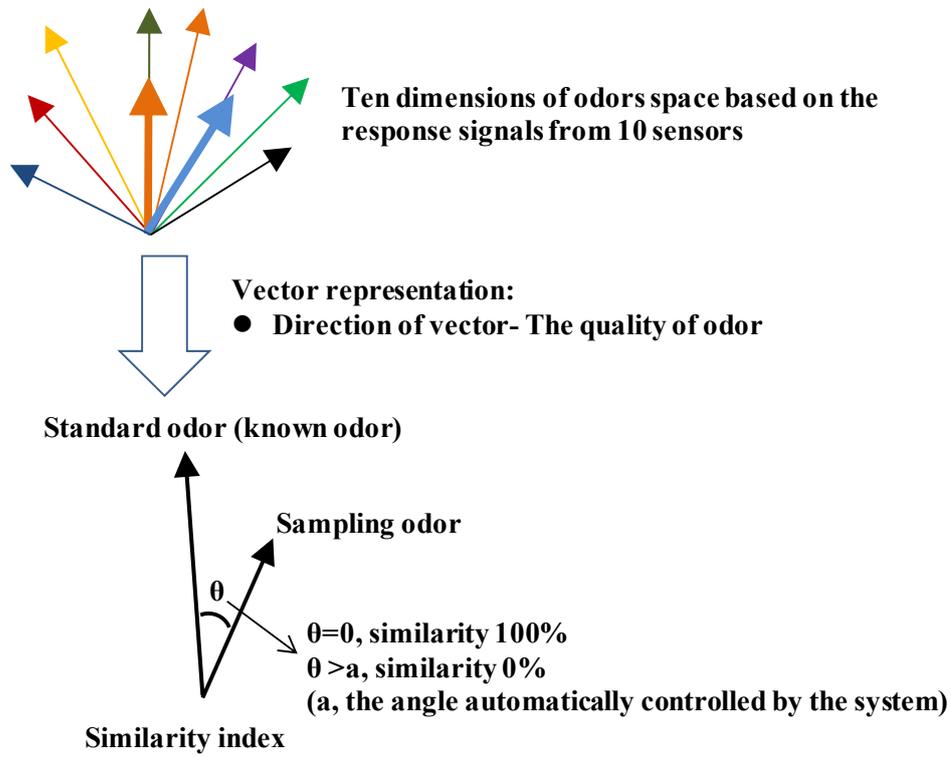
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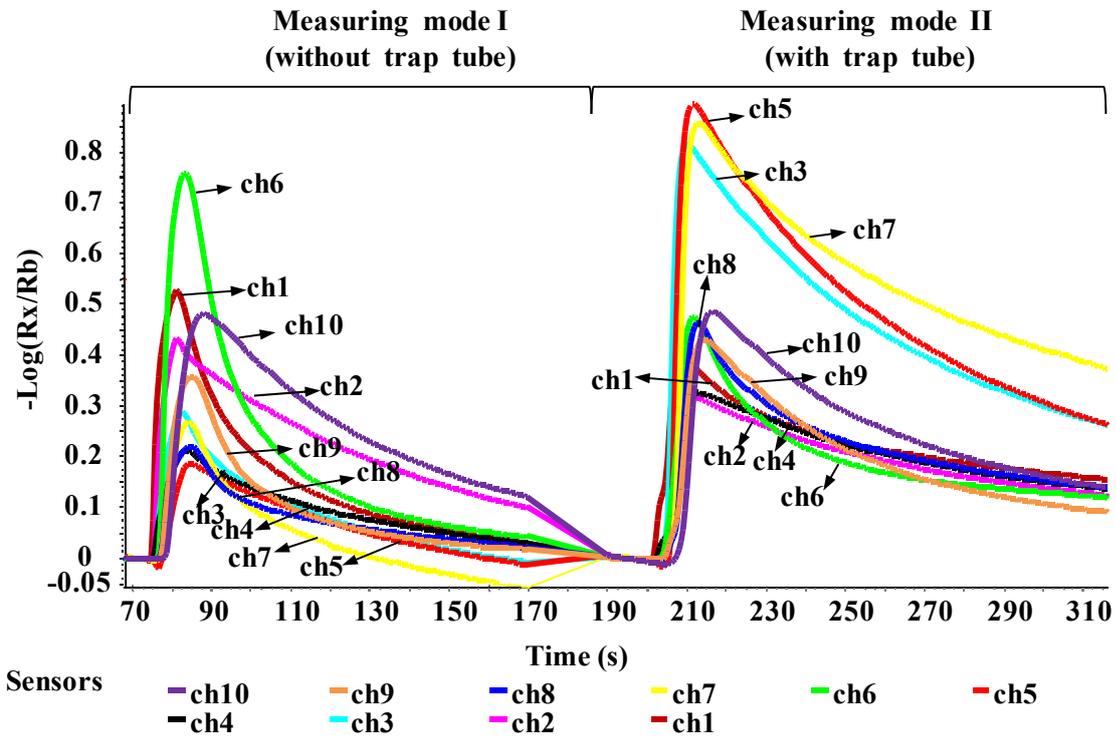
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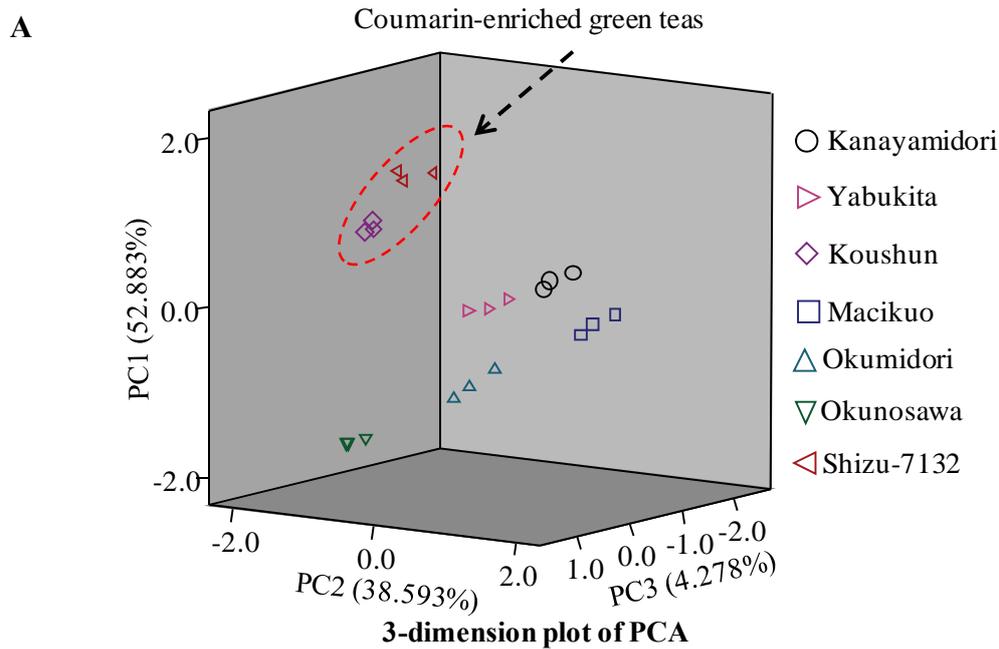
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Fig. 2 Ziyin YANG



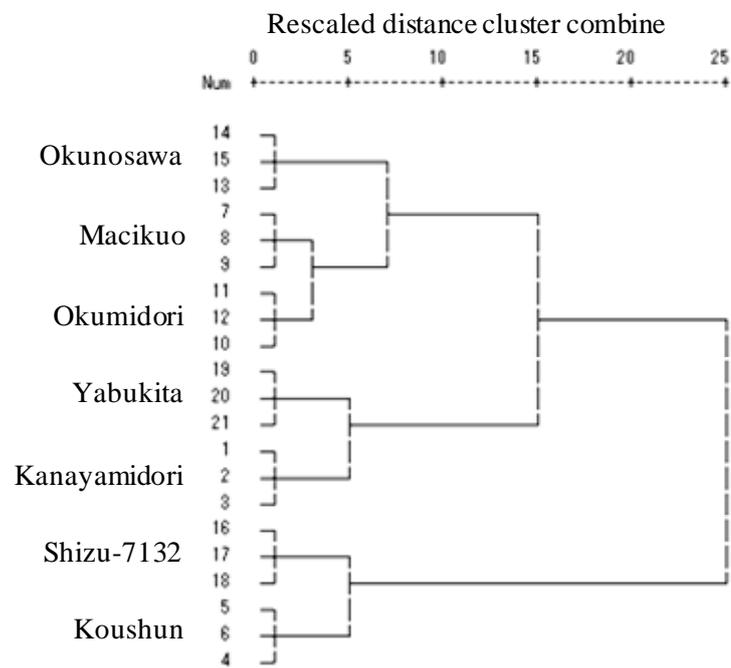
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13 Fig. 3 Ziyin YANG



B

Dendrogram using average linkage (between groups)

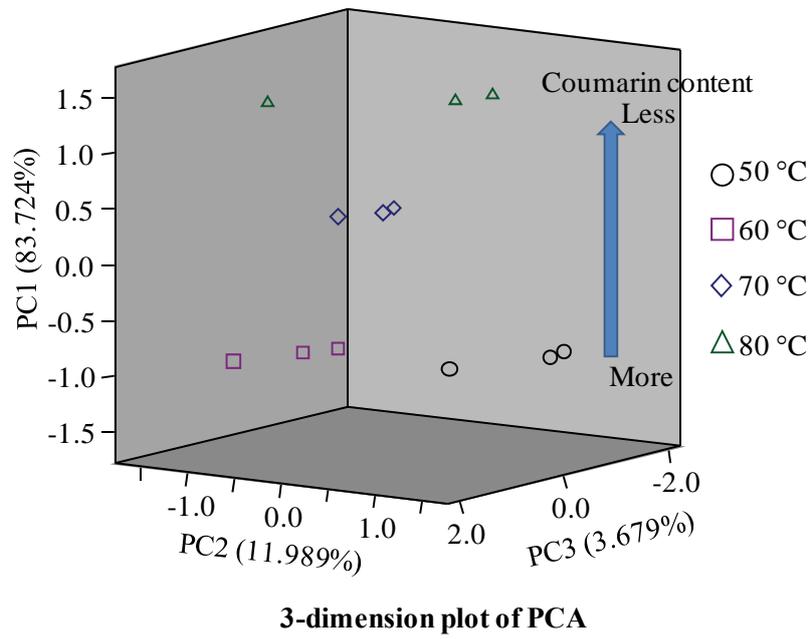


Dendrogram of hierarchical cluster analysis

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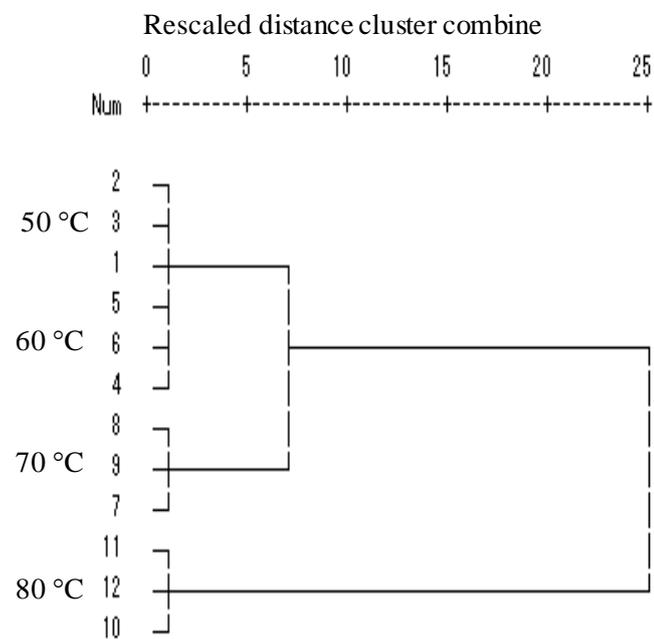
2 **Fig. 4 Ziyin YANG**

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B

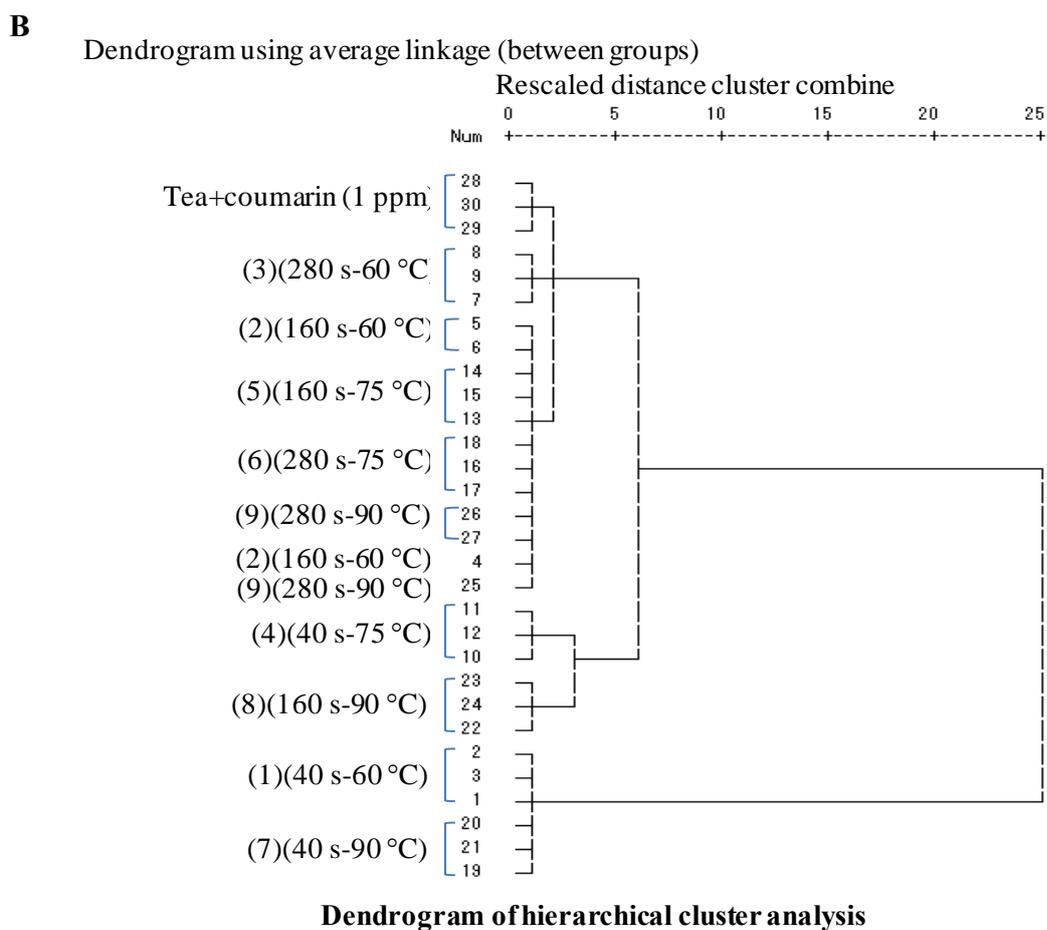
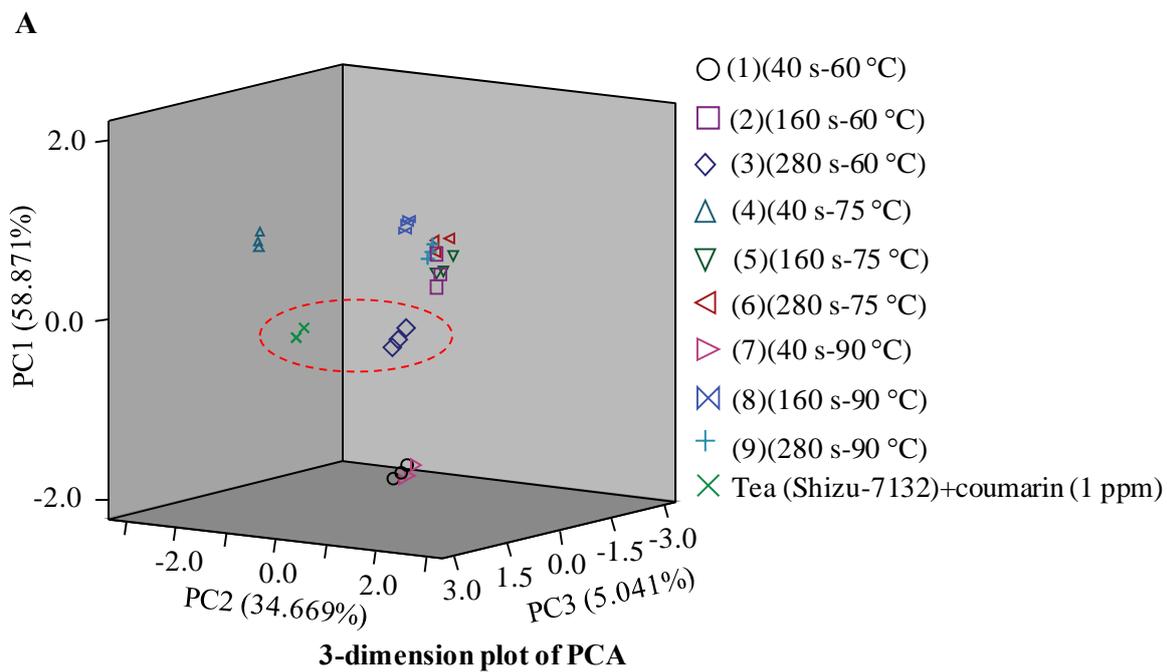
Dendrogram using average linkage (between groups)

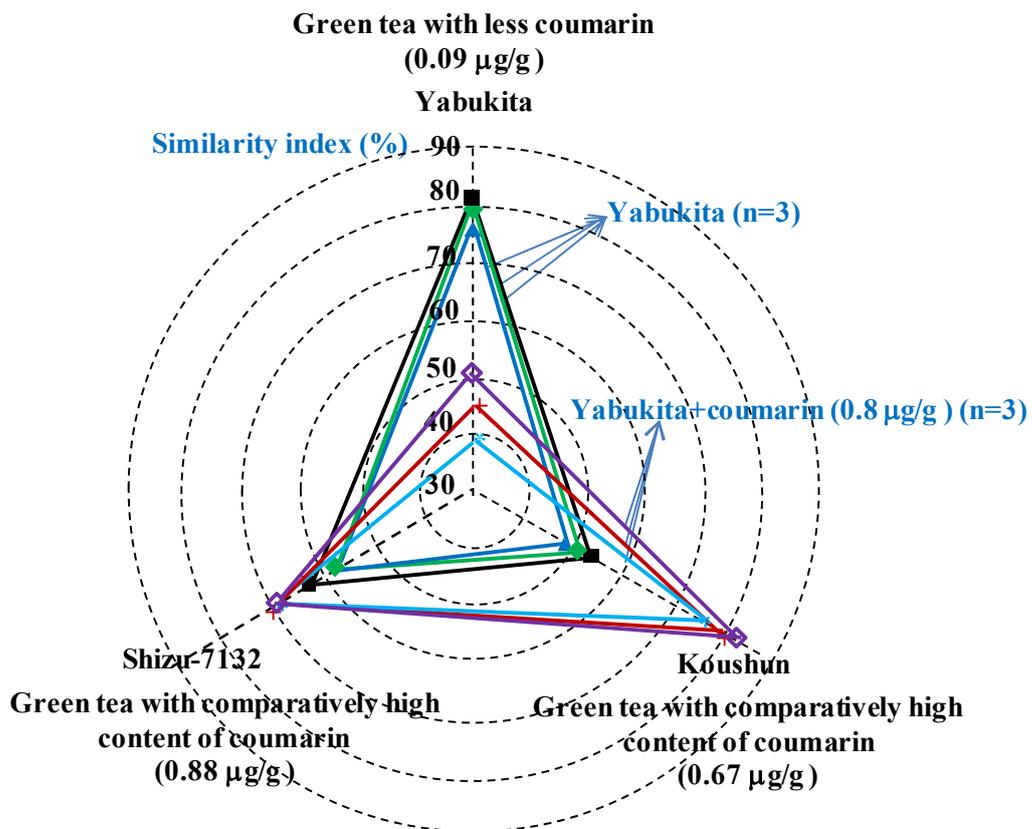


Dendrogram of hierarchical cluster analysis

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2 Fig. 5 Ziyin YANG





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12 **Fig 7 Ziyin YANG**