# Classification of Korean Chrysanthemum Species based on Volatile Compounds Using Cluster Analysis and Principal Component Analysis 

Su Jeong Kim • Tae Joung Ha • Jongyun Kim • Dong Chil Chang • Ki Sun Kim

Received: 16 May 2014 / Accepted: 22 September 2014 / Published Online: 31 December 2014
(C) The Korean Society for Applied Biological Chemistry and Springer 2014


#### Abstract

In the analysis of chemotype relationship among Korean Chrysanthemum species, the volatile compounds in the leaves of 15 taxa were analyzed and identified by gas chromatograph/mass spectrometry. Principal component analysis and cluster analysis used for the grouping based on the volatile compounds. Fifteen taxa of Charysanthemum species were categorized into three groups. Groups I and II included higher ketones than Group III. Group I had five C. zawadskii subspecies: acutilobum, acutilobum var. tenuisectum, acutilobum var. alpinum, lucidum, and coreanum. Five C. zawadskii subspecies were analyzed with main volatile compounds of D-limonene and $m$-thymol. Group II consisted of four C. zawadskii subspecies including naktongense, yezoense, latilobum, and latilobum var. leiophyllum, and one species $C$. makinoi. They consisted of main compounds of linalool, cischrysanthenol, eugenol, and chrysanthenone. Group III included five C. indicum species and related species: C. indicum, var. albescens, var. acuta, C. boreale, and C. lineare. The present study was able to classify volatile compounds of Korean Chrysanthemum species attributable to major compounds, such as hydrocarbons (sabinene, cymene, $\beta$-selinene), alcohols (1-octen-3-ol, cischrysanthenol, hinesol), ketones (chrysanthenone, camphor), and esters (cis-sabiene hydrate, trans-chrysanthenyl acetate).


Keywords borneol • camphor • chrysanthemum • cluster analysis - principal component analysis

## Introduction

Terpenoid contained in the volatile compounds is a substance

[^0]where two or more isoprenes are combined, and its main ingredients are monoterpene $\left(\mathrm{C}_{10} \mathrm{H}_{16}\right)$ and sesquiterpene $\left(\mathrm{C}_{15} \mathrm{H}_{24}\right)$ (Kondjoyan and Berdague, 1996). The volatile compounds of Korean Chrysanthemum species were composed of terpenoids and their oxygen derivatives (Choi et al., 2006). The main volatile compounds were repored to be monoterpenoid compounds such as 1,8 -cineole, $\alpha$-pinene and camphene, and sesquiterpenoid compounds such as $\beta$-caryophyllene, germacrene D (Kim et al., 1998; Hong, 2002).
Previous studies on the classification of Korean Chrysanthemum species were performed via karyotype analysis of somatic chromosome (Kim, 2003), morphological phylogeny (Oh et al., 1994), isozyme genetic studies (Park and Lee, 2004), and genetic characteristics (Lee and Kim, 2000). Whereas, a few studies on the comparison and classification of various Korean Chrysanthemum species based on volatile compounds have also been conducted (Hong, 2002; Woo et al., 2008). Regarding studies on the volatile compounds of Chrysanthemum species, some attempts have been made mainly on the comparisons of volatile compounds according to cultivation conditions (Wang et al., 2008), volatile composition depending on extraction methods (Wang and Yang, 2006), and volatile compounds for developing chrysanthemum tea (Choi et al., 2006).

Recently, plants were studied on numerical taxonomic classification using multivariate data based on the morphological, biochemical, and molecular characteristics (Sung, 2000; Kim et al., 2014). In particular, on the basis of the chemical components like the volatile compounds in plant, multivariate analyses such as principal component analysis (PCA) and cluster analysis have been performed (Chung, 1999; Yun et al., 2002). Cluster analysis is a type of multivariate analysis that divides data with close similarities into groups (clusters) that are meaningful and useful. If meaningful groups are the goal, then the clusters should capture the natural structure of the data. Therefore, as a technique for grouping clusters of similar traits based on the diverse characteristics of certain entities or subjects, cluster analysis can be utilized in
situations where there are no clear or known classification criteria (Sung, 2000). However, little research has been performed on the Korean Chrysanthemum species such as the classification of species based on volatile compounds.

The present study was conducted to obtain clear inter-species classification by using multivariate analysis methods such as PCA and cluster analysis, as well as by analyzing and comparing the volatile compounds of 15 taxa of Korean Chrysanthemum species.

## Materials and Methods

Plant materials. Fifteen taxa of Korean 5 Chrysanthemum species with 5 sub-species and 5 varieties were used at the Highland Agriculture Research Center of the National Institute of Crop Science, Rural Development Administration in Pyeongchang, Korea since 2010 (Table 1). Leaf samples of four individual plants were randomly selected and used in July 2011. These samples were stored at $-70^{\circ} \mathrm{C}$ (deep freezer) and freeze-dried in July 2011. The leaf samples were freeze-dried using a freesing dryer (EDT12012, Operon Co., Korea).
Extraction of volatile compounds. To extract the volatile compounds, Likens and Nickerson type simultaneous steam distillation and extraction (SDE) apparatus with round flask at each end were used in accordance with the method of Schultz et al. (1977). In one of the two round flasks, 2 g freeze-dried samples were added with 500 mL distilled water and heat-refluxed in a $100^{\circ} \mathrm{C}$ heating mantle for 2 h . Subsequently, $50 \mathrm{~mL} n$-pentane: diethyl ether mixture $(1: 1=\mathrm{v}: \mathrm{v})$ was added to the other round flask, and the volatile compounds were extracted by heat-refluxing at $40^{\circ} \mathrm{C}$. Anhydrous sodium sulfate was used for dehydration and after concentration using $99.9 \%$ nitrogen gas by filtering through
a filter paper (No. 1, Whatman International, UK), gas chromatograph/mass spectrophotometer (GC/MS) was used for analysis by dissolving in 0.2 mL diethyl ether.
Analysis of volatile compounds. The extracted volatile compounds were analyzed GC/MS (7890A, Agilent Co., USA) with a HP5 MS capillary column ( $30 \mathrm{~m} \times 0.25 \mathrm{~mm}$ i.d., $0.25 \mu \mathrm{~m}$ film thickness) via split mode (split ratio $=50: 1$ ) and identified via gas chromatograph/mass selective detector (GC/MSD) (Figs. S1, S2, and S3). In the GC analysis, the inlet and detector temperatures were maintained at $250^{\circ} \mathrm{C}$, and the helium carrier gas flow rate was kept at $1.0 \mathrm{~mL} / \mathrm{min}$. The oven temperature was kept at $50^{\circ} \mathrm{C}$ for 5 min , raised the temperature by 7 per min, and maintained at $250^{\circ} \mathrm{C}$ for 30 min . In the GC/MSD conditions, the electron ionization energy was 70 eV , the ion source temperature was $250^{\circ} \mathrm{C}$ and the mass range was $20-400$ a.m.u. Regarding verification of the compounds, tentative identification was made by comparing the mass spectrum obtained using GC/MSD with Wiley 70 database (Wiley 70, Agilent Co., USA) and mass spectral data from the literature (Kondjoyan and Berdague, 1996). Alkane (Aldrich Chemical Co., USA) of $\mathrm{C}_{5}-\mathrm{C}_{20}$ was used as the volatile compound reference material and expressed as percentage (\%) of relative peak area.
Statistical analysis. Based on the results of the analysis using GC/ MSD of the volatile compounds in 15 taxa of Chrysanthemum species, ANOVA and multivariate analyses were performed using SAS program (SAS institute, ver. 9.2, USA). PCA of multivariate analysis methods was conducted to detect the differences among the 15 taxa of Chrysanthemum species with simultaneous consideration of the 45 volatile compounds using proc factor with SAS software. The first three principal components were analyzed through PCA and determined with the two-dimensional plot. Cluster analysis was performed using the volatile compounds of the taxa based on quantitative and qualitative variations, including

Table 1 List of 15 taxa of Korean Chrysanthemum species investigated in the study

| Scientific name | KMRH <br> voucher | Cites (Natural habitats) |
| :--- | :--- | :--- |
| C. zawadskii Herbich ssp. acutilobum (DC.) Kitagawa | MPS003031 | Mt. Yumyeong, Gyeonggi, Korea |
| C. zawadskii Herbich ssp. acutilobum (DC.) Kitagawa var. tenuisectum (Kitagawa) Y. Lee | MPS003032 | Pocheon, Gyeonggi, Korea |
| C. zawadskii Herbich ssp. acutilobum (DC.) Kitagawa var. alpinum (Nak.) Y. Lee | MPS003033 | Mt. Baekdu, Hambuk, Korea |
| C. zawadskii Herbich ssp. lucidum (NAK.) Y .Lee | MPS003034 | Ullung, Gyeongnam, Korea |
| C. zawadskii Herbich ssp. coreanum (NAK.) Y. Lee | MPS003035 | Mt. Halla, Jeju, Korea |
| C. zawadskii Herbich ssp. naktongense (NAK.) Y. Lee | MPS003037 | Gimhae, Gyeongbuk, Korea |
| C. zawadskii Herbich ssp. yezoense (Maekawa.) Y. Lee | MPS003039 | Goheung, Jeonnam, Korea |
| C. zawadskii Herbich ssp. latilobum (Maxim.) Kitagawa | MPS003041 | Wando, Jeonnam, Korea |
| C. zawadskii Herbich ssp. latilobum (Maxim.) Kitagawa var. leiophyllum (Nak.) Y. Lee | MPS003043 | Gangneung, Gangwon, Korea |
| C. indicum Linné | MPS003044 | Anmyeondo, Chungnam, Korea |
| C. indicum Linné var. albescens Makino | MPS003046 | Jeongseon, Gangwon, Korea |
| C. indicum var. acuta (Uyeki) Kitam. | MPS003047 | Byeonsanbando, Jeonbuk, Korea |
| C. boreale (Mak.) Makino | MPS003049 | Pyeongchang, Gangwon, Korea |
| C. lineare Matsumura | MPS003050 | Mt. Chilbo, Gyeonggi, Korea |
| C. makinoi Matsumura et Nakai | MPS003051 | Daegu, Korea |

${ }^{\text {a }}$ KMRH, Korea Medicinal Resouces Herbarium at Rural Development Administration in Korea.

Ward's minimum variance clustering method displayed dendrogram, the cubic clustering criterion and the Pseudo option that display Pseudo $F$ and $t^{2}$ (PST2) statistics. The number of groups in cluster analysis was decided based on the cluster history.

## Results and Discussion

## Compositions of volatile compounds of Korean Chrysanthemum

species. The range and average values of percentage compositions of the 45 volatile compounds analyzed from the 15 taxa of Korean Chrysanthemum species are shown in Table 2. There were variations among taxa with major compounds of relative peak areas: 20.01 camphor, 12.31 cis-chrysanthenol, 10.95 phytol, and 7.92\% borneol.

The previously reported compositions of volatile compounds of Asteraceae differed slightly as determined by several researchers. Borneol, 1,8-cineole, $\alpha$-thujone, and camphor, reported as the main volatile compounds of Artemisia species, were similar to the volatile compounds of Chrysanthemum species (Morteza-Semnani et al., 2005; Chung, 2009). However, examining the volatile compounds of plants in other genus of the same Asteraceae, the commonly detected compounds in Ligularia fischeri var. spiciformis, Ligularia fischeri var. spiciformis, Synurus deltoids, and Aster scaber were detected to be caryophyllene, terpinole, $\alpha$ cubebene, which showed different volatile compounds (Lee et al., 2012).

Even though camphor was found to be the main volatile compound in the genus Chrysanthemum species, the other volatile compounds were reported differently according to the taxa. Matsuo et al. (1973) reported cis-chrysanthenol acetate, $p$-cymene, camphor, borneol, and bornyl acetate as the main volatile compounds of C. shiwogiku, and camphor, bornyl acetate, 1,8cineole, and chrysanthenone as the main volatile compounds of $C$. japonense. In addition, Nikerson and Likens (1996) reported that camphene, 1,8-cineole, camphor, borneol, and bornyl acetate were the main volatile compounds of $C$. japonense var. debile, and that $\alpha$-pinene, 1,8-cineole, camphor, and $t$-muurolol were the main volatile compounds of C. cuneifolium. In C. indicum and C. boreale; the reported main volatile compounds were camphor, borneol, $\alpha$-pinene, camphene, 1,8 -cineole, and germacrene-D (Hong, 2002; Choi et al., 2006; Bae and Lee, 2008; Woo et al., 2008).

Principal component analysis (PCA) of volatile compounds. Volatile compounds were evaluated and coded by each graded value to classify 15 taxa of Korean Chrysanthemum species. Table 3 showed the eigenvalues and their contribution through the PCA using 45 volatile compounds. PCA is a method that can be used to identify patterns in a data set and to reduce dimentionality of multivariate data by removing inter-correlations among variables (Iezzoni and Pritts, 1991; Sung, 2000). Data was analyzed all variables, found the principal component and got meaning in that main component. We could obtain the eigenvalues of the matrix
consisting of a component of the variance and convariance parameter. In the case of the first Principal component (PC1), the eigenvalue of each of the characteristics was 10.47 , thereby showing a $23.28 \%$ contribution on the total variation. The second and third PCs had eigenvalues of 6.76 and 5.82 , respectively, and the degree of contribution on the total variation was $51.25 \%$. The first 10 PCs in Table 3 showed $91.33 \%$ cumulative proportion by PCA. Each of the 10 PCs was presented in one characteristic, because the eigenvalues were over 1.68, which was more informative than any single variable alone (Iezzoni and Pritts, 1991).
In addition, to estimate the characteristics contained in the various volatile compounds, correlations between the individual PCs were analyzed (Table 4). The eigenvalues of each PC were the total number of hypothetic variables analyzed by PCA, indicating that the first, second, and third PCs represented approximately 10 , 7, and 6 variables among the 45 volatile compounds of Korean Chrysanthemum species, respectively. The first PC showed a highly correlated eigenvalue with 10 volatile compounds including sabinene, cymene, $\beta$-selinene, 1 -octen- 3 -ol, cis-chrysanthenol, hinesol, chrysanthenone, camphor, cis-sabinene hydrate, and tanschrysanthenyl acetate, among which sabinene showed the highest correlation based on loading of PC at 0.274976 followed by camphor at 0.259927 and cis-chrysanthenol at 0.246447 . In the case of the second PC, $m$-thymol showed the highest correlation based on loading of PC at 0.370277 followed by borneol. The third PC was closely related with alcohols including 1-decanol, pentadecanoic acid, and $\alpha$-cadinol.

As a result of arranging the values of the first and second PCs on a 2-dimensional scatter diagram for 15 taxa of Korean Chrysanthemum species, these were categorized into three groups (Fig. 1). Five C. zawadskii subspecies having with main volatile compounds of D -limonene and $m$-thymol were located in the middle part of plot 1 and upper part of plot 2 (Fig. 1; Group I). The present study corresponded that D-limonene was reported as the main compounds in Ligularia fischeri var. spiciformis and Ligularia fischeri var. spiciformis in Asteraceae (Lee, 2012). However, this compound was neither detected in Aster scaber nor in Synurus deltoid (Lee, 2012). When the genus Thymus was analyzed, it was further observed that even though the main compound of T. quinquecostatus var. quinquecostatus was cymene, the main compound of $T$. quinquecostatus var. japonica was $m$-thymol. These results showed that each speices has different chemotypes, making it possible to completely distinguish the species (Kwon et al., 2006). Thus, the main compounds of $m$ thymol and limonene in 15 taxa of Korean Chrysanthemum species corresponded to Thymus based on classification results.

In the result of PCA, four C. zawadskii subspecies and C. makinoi, having main volatile compounds of linalool, cischrysanthenol, eugenol, and chrysanthenone, were located in the right part of plot 1 and lower part of plot 2 (Fig. 1; Group II). Using plants as basic materials in perfumes and cosmetics, among others (Arctander, 1969), linalool was contained in Matricaria recutita flower, C. boreale flower and Camellia sinensis leaf

Table 2 List of 45 volatile compounds and their range of values in Korean Chrysanthemum species

| Functional group | Volatile compounds | R.T. | MW | Minimum Value | Maximum value | Mean $\pm$ SD | $F$ value ${ }^{\text {a }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Hydrocarbones | 2,4-Dimethyl-heptene | 5.80 | 126 | 0.02 | 0.57 | $0.20 \pm 0.18$ | $1.51{ }^{\text {NS }}$ |
|  | $\alpha$-Thujene | 8.51 | 136 | 0.03 | 0.15 | $0.10 \pm 0.05$ | $2.85{ }^{\text {NS }}$ |
|  | $\alpha$-Pinene | 8.72 | 136 | 0.01 | 1.33 | $0.67 \pm 0.40$ | $0.66{ }^{\text {NS }}$ |
|  | Camphene | 9.22 | 136 | 0.06 | 3.57 | $0.84 \pm 0.98$ | $1.90{ }^{\text {NS }}$ |
|  | Sabinene | 9.93 | 136 | 0.06 | 0.70 | $0.32 \pm 0.24$ | 14.23*** |
|  | $\beta$-Pinene | 10.01 | 136 | 0.05 | 1.41 | $0.37 \pm 0.44$ | $1.83{ }^{\text {NS }}$ |
|  | $\alpha$-Terpinene | 13.22 | 136 | 0.02 | 1.30 | $0.39 \pm 0.44$ | $3.72{ }^{\text {NS }}$ |
|  | Cymene | 11.46 | 134 | 0.02 | 1.36 | $0.64 \pm 0.52$ | 4.62* |
|  | Limonene | 11.51 | 136 | 0.06 | 0.97 | $0.28 \pm 0.34$ | $2.34{ }^{\text {NS }}$ |
|  | $\gamma$-Terpinene | 12.43 | 136 | 0.11 | 1.21 | $0.59 \pm 0.35$ | 7.77** |
|  | $\alpha$-Thujone | 13.93 | 152 | 0.05 | 0.28 | $0.17 \pm 0.12$ | 5.46* |
|  | trans-Caryophyllene | 13.90 | 204 | 0.21 | 2.62 | $0.99 \pm 0.74$ | $0.71{ }^{\text {NS }}$ |
|  | $\beta$-Selinene | 21.63 | 204 | 0.19 | 1.79 | $0.84 \pm 0.60$ | 4.21* |
|  | Germacrene-D | 21.73 | 204 | 0.18 | 3.71 | $1.61 \pm 1.09$ | $1.72{ }^{\text {NS }}$ |
|  | $\alpha$-Muurolene | 21.97 | 204 | 0.15 | 3.80 | $1.72 \pm 1.80$ | $3.15{ }^{\text {NS }}$ |
|  | $\delta$-Cadinene | 22.44 | 204 | 0.09 | 8.03 | $2.65 \pm 2.46$ | $0.96{ }^{\text {NS }}$ |
|  | $\alpha$-Longipinene | 19.29 | 204 | 3.80 | 3.80 | $3.80 \pm 0.00$ | $1.00^{\mathrm{NS}}$ |
|  | Caryophyllene oxide | 23.59 | 220 | 1.11 | 3.90 | $2.49 \pm 1.00$ | $0.14{ }^{\text {NS }}$ |
|  | $\gamma$-Gurjunene | 23.67 | 204 | 0.65 | 2.84 | $1.34 \pm 0.73$ | $1.28{ }^{\text {NS }}$ |
| Alcohols | 1-Octen-3-ol | 10.13 | 128 | 0.06 | 0.58 | $0.27 \pm 0.17$ | 7.51** |
|  | 1-Decanol | 12.10 | 158 | 1.77 | 1.77 | $1.77 \pm 0.00$ | $1.00{ }^{\text {NS }}$ |
|  | Linalool | 13.41 | 154 | 0.07 | 0.76 | $0.36 \pm 0.27$ | 9.04** |
|  | cis-Chrysanthenol | 13.90 | 152 | 9.24 | 14.81 | $12.31 \pm 2.75$ | 100.47*** |
|  | Borneol | 15.13 | 154 | 0.62 | 20.94 | $7.92 \pm 7.91$ | 14.15*** |
|  | Epoxylinalol | 15.26 | 170 | 0.03 | 0.03 | $0.03 \pm 0.00$ | $1.00{ }^{\text {NS }}$ |
|  | $\alpha$-Terpineol | 15.63 | 154 | 0.28 | 1.53 | $0.88 \pm 0.44$ | $10.10^{* *}$ |
|  | Myrtenol | 15.79 | 152 | 0.23 | 2.85 | $0.99 \pm 0.73$ | $0.23^{\mathrm{NS}}$ |
|  | Piperitol | 17.14 | 152 | 0.14 | 12.39 | $4.20 \pm 5.78$ | $1.98{ }^{\text {NS }}$ |
|  | $m$-Thymol | 17.74 | 150 | 1.97 | 4.26 | $3.09 \pm 0.84$ | 68.62*** |
|  | Eugenol | 19.25 | 164 | 0.06 | 1.80 | $0.84 \pm 0.86$ | $3.24{ }^{\text {NS }}$ |
|  | Hinesol | 24.51 | 222 | 2.95 | 6.73 | $4.49 \pm 1.68$ | 10.49** |
|  | $\alpha$-Cadinol | 24.52 | 222 | 2.62 | 2.62 | $2.62 \pm 0.00$ | $1.00{ }^{\text {NS }}$ |
|  | Phytol | 31.36 | 296 | 4.05 | 21.62 | $10.95 \pm 4.96$ | $2.52^{\text {NS }}$ |
| Aldehydes | trans-2-Hexenal | 6.25 | 98 | 0.01 | 0.80 | $0.25 \pm 0.23$ | $2.95{ }^{\text {NS }}$ |
| Ketones | Chrysanthenone | 14.12 | 150 | 0.25 | 1.99 | $1.06 \pm 0.63$ | 14.32*** |
|  | Camphor | 14.61 | 152 | 6.44 | 33.22 | $20.01 \pm 9.03$ | $13.34 * * *$ |
|  | Pinocarvone | 15.05 | 150 | 0.02 | 1.07 | $0.56 \pm 0.39$ | $0.04^{\mathrm{NS}}$ |
|  | Thyme camphor | 17.75 | 150 | 0.26 | 2.98 | $1.20 \pm 1.08$ | 6.18* |
| Acids | Pentadecanoic acid | 28.73 | 270 | 0.31 | 0.31 | $0.31 \pm 0.00$ | $1.00{ }^{\text {NS }}$ |
|  | Hexadecanoic acid | 29.32 | 256 | 0.23 | 4.95 | $1.15 \pm 1.50$ | $1.82^{\mathrm{NS}}$ |
| Esters | 1,8-Cineole | 11.65 | 154 | 0.02 | 3.50 | $0.80 \pm 0.85$ | $0.41{ }^{\text {NS }}$ |
|  | trans-Sabinene hydrate | 12.60 | 154 | 0.04 | 6.97 | $2.16 \pm 2.66$ | $3.59{ }^{\text {NS }}$ |
|  | cis-Sabiene hydrate | 13.38 | 154 | 0.18 | 3.37 | $1.72 \pm 1.10$ | 4.87* |
|  | trans-Chrysanthenyl acetate | 16.68 | 194 | 0.14 | 0.68 | $0.36 \pm 0.18$ | 11.53** |
|  | Bornyl acetate | 17.74 | 196 | 0.40 | 2.66 | $1.28 \pm 0.85$ | $3.31{ }^{\text {NS }}$ |

[^1]Table 3 Eigenvalues and contributions of the first 10 principal components using 45 volatile compounds found in Korean Chrysanthemum species

| Principal component | Eigenvalue | Difference | Contribution (\%) | Cumulative contribution (\%) |
| :---: | :---: | :---: | :---: | :---: |
| PC 1 | 10.47 | 3.71 | 23.28 | 23.28 |
| PC 2 | 6.76 | 0.93 | 15.03 | 38.30 |
| PC 3 | 5.82 | 2.22 | 12.95 | 51.25 |
| PC 4 | 3.60 | 0.48 | 8.00 | 59.25 |
| PC 5 | 3.11 | 0.25 | 6.92 | 66.17 |
| PC 6 | 2.86 | 0.39 | 6.36 | 72.53 |
| PC 7 | 2.47 | 0.18 | 5.50 | 78.03 |
| PC 8 | 2.29 | 0.28 | 5.10 | 83.13 |
| PC 9 | 2.01 | 0.33 | 4.47 | 87.60 |
| PC 10 | 1.68 | 0.42 | 3.73 | 91.33 |

(Choi et al., 2006). It was further determined to be an index compound where taxa could be identified only in Group II. In addition, most compounds in Group II were detected quite similarly to the volatile compounds of Group I.

Five taxa were located in the left part of plot 1 and lower part of plot 2 (Fig. 1; Group III). C. indicum, C. indicum var. albescens, C. indicum var. acuta, C. boreale, and C. lineare had mainly $\alpha$-thujene, $\alpha$-muurolene, piperitol, and hinesol due to the different volatile compounds of Groups I and II. C. lineare contained 1-decanol, $\alpha$-cadinol, pentadecanoic acid compounds, which were detected specifically in Group III, showed a different pattern. Even though $\alpha$-terpineol was identified in Groups I and II, it was determined to be an index compound among taxa, because it was not identified in Group III.
Cluster analysis of compositions of volatile compounds. Cluster analysis was performed based on 45 volatile compounds and showed the dendrogram of relationships among 15 taxa of Chrysanthemum species. The number of clusters was distinguished through statistics such as cubic clustering criterion, PST2, pseudo F (PSF), among others (Fig. 2). When the volatile compounds were subjected to cluster analysis using an average distance of 0.15 semi-partial R square (RSQ) as the criterion, it was possible classify volatile compounds into 3 groups baed on the cluster history. Group I included C. zawadskii ssp. acutilobum, ssp. acutilobum var. tenuisectum, ssp. acutilobum var. alpinum, ssp. lucidum, and ssp. coreanum. In the case of C. zawadskii ssp. lucidum, it was distinguished within Group I due to observation of $\alpha$-longipinene. This is deemed attributable to the unique volatile compounds generated in the leaf, because C. zawadskii ssp. lucidum grew only in the habitual environment of island in the East Sea of Korea.

Group II included 5 taxa that were mostly distributed geographically in the southern regions of the Korean Peninsula. These taxa were C. zawadskii ssp. naktongense, ssp. yezoense, ssp. latilobum, ssp. latilobum var. leiophyllum, and C. makinoi. However, C. makinoi was rather distant in terms of phylogenetic relationship with the other taxa contained in Group II.

Group III consisted of 5 taxa of $C$. indicum, var. albescens, var. acuta, C. boreale, and C. lineare. On the other hand, C. lineare


Fig. 1 Plot based on principal component analysis in 15 taxa of Korean Chrysanthemum species. C. zawadskii ssp. acutilobum (A), C. zawadskii ssp. acutilobum var. tenuisectum (B), C. zawadskii ssp. acutilobum var. alpinum (C), C. zawadskii ssp. lucidum (D), C. zawadskii ssp. coreanum (E), C. zawadskii ssp. naktongense (F), C. zawadskii ssp. yezoense (G), C. zawadskii ssp. latilobum (H), C. zawadskii ssp. latilobum var. leiophyllum (I), C. indicum (J), C. indicum var. albescens (K), C. indicum var. acuta (L), C. boreale (M), N; C. lineare (N), C. makinoi (O).
was detected in 1-decanol, $\alpha$-cadinol, and pentadecanoic acid which had not been seen in other taxa. In addition, $\delta$-cadinene was detected in all 14 taxa of Chrysanthemum species except for $C$. lineare.

Comparing the inter-group characteristics of Chrysanthemum species through a cluster analysis, functional group of volatile compounds such as hydrocarbons, alcohols, aldehydes, ketones, acids, and esters showed differences (Fig. 3). In Group I, the composition of aldehyde was relatively low, whereas the compositions of alcohols and esters were high. In Group II, the composition of ketones was high whereas the compositions of alcohols and acids were relatively low. In Group III, the compositions of alcohols and acids were higher in relation to Groups I and II, whereas the compositions of ketones were lower

Table 4 Loadings of three principal components among 45 volatile compounds in Korean Chrysanthemum species

| Functional group | Volatile compounds | Loading of principal component |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  |  | PC 1 | PC 2 | PC 3 |
| Hydrocarbones | 2,4-Dimethyl-heptene | 0.151169 | -0.036358 | -0.081854 |
|  | $\alpha$-Thujene | 0.156667 | 0.073682 | 0.133573 |
|  | $\alpha$-Pinene | 0.107073 | 0.033887 | -0.131258 |
|  | Camphene | -0.112005 | 0.115246 | 0.005350 |
|  | Sabinene | $\underline{0.274976}{ }^{\text {a }}$ | -0.077003 | 0.031517 |
|  | $\beta$-Pinene | 0.148728 | 0.005741 | -0.017851 |
|  | $\alpha$-Terpinene | 0.042363 | 0.246840 | -0.019599 |
|  | Cymene | 0.217660 | 0.078302 | 0.023357 |
|  | Limonene | 0.050832 | 0.208936 | 0.009159 |
|  | $\gamma$-Terpinene | 0.186282 | 0.191088 | 0.087366 |
|  | $\alpha$-Thujone | -0.187067 | $-0.147448$ | 0.017357 |
|  | trans-Caryophyllene | -0.137563 | 0.018842 | 0.232685 |
|  | $\beta$-Selinene | 0.207477 | -0.071048 | 0.104086 |
|  | Germacrene-D | -0.040842 | -0.169127 | -0.085989 |
|  | $\alpha$-Muurolene | -0.172210 | -0.094069 | 0.155605 |
|  | $\delta$-Cadinene | 0.089344 | 0.032327 | 0.016232 |
|  | $\alpha$-Longipinene | -0.038363 | 0.176341 | -0.070457 |
|  | Caryophyllene oxide | -0.059811 | -0.016015 | 0.275720 |
|  | $\gamma$-Gurjunene | -0.082181 | 0.068966 | 0.316431 |
| Alcohols | 1-Octen-3-ol | 0.232682 | 0.031638 | 0.028810 |
|  | 1-Decanol | -0.070376 | -0.010000 | -0.326521 |
|  | Linalool | 0.179901 | -0.165416 | -0.016956 |
|  | cis-Chrysanthenol | 0.246447 | -0.203264 | -0.005911 |
|  | Borneol | -0.087005 | 0.299217 | 0.057413 |
|  | Epoxylinalol | 0.056441 | -0.038169 | -0.101769 |
|  | $\alpha$-Terpineol | 0.188122 | 0.186852 | 0.040418 |
|  | Myrtenol | -0.057896 | -0.082279 | 0.319047 |
|  | Piperitol | -0.134099 | -0.130623 | 0.036826 |
|  | $m$-Thymol | 0.008844 | 0.370277 | 0.037989 |
|  | Eugenol | 0.169627 | -0.121044 | 0.019953 |
|  | Hinesol | -0.232142 | -0.157992 | 0.177239 |
|  | $\alpha$-Cadinol | -0.070376 | -0.010000 | -0.326521 |
|  | Phytol | -0.109881 | -0.161784 | -0.150459 |
| Aldehydes | trans-2-Hexenal | 0.131332 | -0.185657 | 0.096000 |
| Ketones | Chrysanthenone | 0.205682 | -0.183751 | 0.000285 |
|  | Camphor | 0.259927 | -0.022520 | 0.006863 |
|  | Pinocarvone | -0.009726 | -0.104409 | 0.191614 |
|  | Thyme camphor | 0.018116 | $\mathbf{0 . 2 5 5 2 8 4}$ | 0.105630 |
| Acids | Pentadecanoic acid | -0.070376 | -0.010000 | -0.326521 |
|  | Hexadecanoic acid | -0.134942 | -0.131552 | 0.061932 |
| Esters | 1,8-Cineole | -0.057421 | 0.059248 | 0.236369 |
|  | trans-Sabinene hydrate | 0.078373 | 0.212838 | 0.092349 |
|  | cis-Sabiene hydrate | 0.234741 | 0.024207 | 0.071986 |
|  | trans-Chrysanthenyl acetate | 0.243119 | -0.130490 | 0.014068 |
|  | Bornyl acetate | -0.050397 | 0.269687 | -0.209525 |

[^2]

Fig. 2 Dendrogram of 15 taxa of Korean Chrysanthemum species classified by ward's minimum variance clustering method.


Fig. 3 Differnence in functional group of volatile compounds of Korean Chrysanthemum species classified by cluster analysis.
than Groups I and II. The present study also corresponded the previous report that mainly hydrocarbons and alcohols were contained as volatile compounds in $C$. boreale in large quantities (Choi et al., 2006).

Taxonomic studies of Chrysanthemum species have been conducted mainly through the morphological camparison (Oh et al., 1994), anatomical analysis (Kim et al., 2003) and chromosomal study (Kim, 2003). In the present study, the volatile compounds of 15 taxa were analyzed with GC/MSD as well as through multivariate analysis techniques of PCA and cluster analysis, thereby confirming the possibility of classifying the 15 taxa of Chrysanthemum species into three groups. Thus, it was determined that the chemo-taxonomy technique using the compositions of the volatile compounds of Chrysanthemum
species would be useful in the classification and identification of the verified inter-species differences. Finally, the present study provided the basic materials needed for species selection and cultivation of Chrysanthemum species, which are useful for foods, cosmetics, and medicine.

Acknowledgment The work was supported by a grant from the Rural Development Administration (ATIS code PJ00646008 and PJ00876405) in Republic of Korea. The authors would like to thank Dr. Jeong-Hun Lee and Ms. Mi Yeong Park for their assistance in the herbaria voucher specimen production. The authors are also grateful to Ms. Hye-Rim Lee of the RDA for the critical review of the statistical analysis of the study.

## References

Arctander S (1969) In Flavor descriptions Perfume and flavor chemicals, Allured Pub Corp, USA.
Bae SM and Lee SC (2008) Effect of rot-air drying temperature on volatile compounds in Chrysanthemum boreale M. flowers. Kor J Food Technol 40, 466-9.
Choi SH, Im SI, and Bae JE (2006) Analysis of aroma components flower tea of German chamomile and Chrysanthemum boreale Makino. Kor J Food Cookery Sci 22, 768-73.
Chung KH (1999) Morphological characteristics and principal component analysis of plums. Kor J Hort Sci Technol 17, 23-8.
Chung MS (2009) Changes in the volatile compounds of Artemisia princeps var. orientalis essential oils during storage. Food Sci Biotechnol 18, 4817.

Hong CU (2002) Essential oil composition of Chrysanthemum boreale and Chrysanthemum indicum. J Kor Soc Agric Chem Biotechnol 45, 108-13.
Iezzoni AF and Pritts MP (1991) Applications of principal component analysis to horticultural research. HortScience 26, 334-8.
Kim JS (2003) A study of diversity and speciation in Dendranthema zawadskii and its related species (Asteraceae). Ph D Thesis, Kyoto University, Japan.
Kim JS, Park JH, Seo BB, and Tobe H (2003) Karyotypes of metaphase chromosomes in diploid populations of Dendranthema zawadskii and related species (Asteraceae) from Korea: diversity and evolutionary
implications. $J$ Plant Res 116, 47-55.
Kim SJ, Lee CH, Kim J, and Kim KS (2014) Phylogenetic analysis of Korean native Chrysanthemum species based on morphological characteristics. Sci Hort 175, 278-89.
Kim SK, Lee SC, Kang DK, Chung SH, and Lee SD (1998) Essential oil content and composition of aromatic constituents in some medicinal plant. Kor J Plant Res 11, 279-82.
Kondjoyan N and Berdague JL (1996) In Aromatic compounds A compilation of relative retention for the analysis of aromatic compounds, (1st ed.), Laboratire flaveur Press, France.
Kwon YH, Lee DS, Choi K, Oh SH, Shin YJ, Oh SY, Kim HJ, Park KW, Kim HJ, and Lee DS (2006) Characterization of fragrances from genus Thymus by GC-MS. J Kor For Soc 287-9.
Lee CH and Kim KS (2000) Genetic diversity of Chrysanthemum zawadskii Herb. and the related groups in Korea using RAPD. J Kor Soc Hort Sci 41, 230-6.
Lee KC, Sa JY, Wang MH, and Han SS (2012) Comparison of volatile aroma compounds between Synurus deltoids and Aster scaber leaves. J Med Crop Sci 20, 54-62.
Matsuo A, Uchio Y, Nakayama M, and Hayashi S (1973) The isolation of trans-chrysanthenyl acetate and chrysanthenone from the essential oil of Chrysanthemum shiwogiku. Bull Chem Soc Jap 46, 1565-7.
Morteza-Semnani K, Akbarzadeh M, and Moshiri K (2005) Essential oil composition of Artemisia fragrans wild from Iran. Flavour Fragr J 20, 330-1.
Nikerson GB and Likens ST (1996) Gas chromatographic evidence for
occurrence of hop oil compounds in beer. J Chromatogr 21, 1-5.
Oh IS, Yoo SO, and Bae JH (1994) Morphological characteristic of Chrysanthemum zawadskii Herb native to Korea. J Kor Soc Hort Sci 35, 78-87.
Park KR and Lee CH (2004) The genetic evidence for polyploid origin of Chrysanthemum zawadskii complex. J Basic Sci 19, 99-112.
Schultz TH, Flath RA, Mon TR, Eggling SB, and Teranishi R (1977) Isolation of volatile compounds from a model system. J Agr Food Chem 25, 4469.

Sung WH (2000) In Principal Component Analysis Applied multivariate statistics, (2nd ed.), Tamjin Press, Korea.
Wang YJ and Yang XW (2006) GC-MS analysis of essential oil of the flower of the Chrysanthemum morifolium by the different processing methods. China J Chinese Material Medica 31, 456-9.
Wang YJ, Guo QS, Yang XW, Xu WB, and Tao HY (2008) Characterization of chemical components of essential oil from flowers of Chrysanthemum morifolium produced in Anhui province. China J Chinese Materia Medica 33, 2207-11.
Woo KS, Yu JS, Hwang IG, Lee YR, Lee CH, Yoon HS, Lee JS, and Jeong HS (2008) Antioxidative activity of volatile compounds in flower of Chrysanthemum indicum, C. morifolium, and C. zawadskii. J Kor Soc Food Sci Nutr 37, 805-9.
Yun JS, Son SY, Kim IH, Hong EY, and Yun T (2002) Classification of Polygonatum ssp. collections based on multivariate analysis. Kor J Med Crop Sci 10, 333-9.


[^0]:    S. J. Kim ( $\boxtimes$ ) $\cdot$ T. J. Ha • J. Kim $\cdot$ D. C. Chang $\cdot$ K. S. Kim

    Highland Agriculture Research Center, National Institute of Crop Science, Rural Development Administration, 5481 Gyeonggangro, Pyeongchang 232-955, Republic of Korea
    E-mail: sjkim30@korea.kr

[^1]:    ${ }^{\text {a }}$ The variables in 15 taxa of Korean Chrysanthemum species expressed ${ }^{\text {NS }}$ non-significant, $*$ Significant at $p \leq 0.05$, **Significant at $p<0.01$, or
    $* * *$ Significant at $p<0.001$.

[^2]:    ${ }^{a}$ Underlined loading was the trait that had higher correlation with principal component of column.

