Molecules 2018, 23, 2062; doi:10.3390/molecules23082062 www.mdpi.com/journal/molecules

Article

UPLC-QTOF/MS-Based Metabolomics Applied for the Quality Evaluation of Four Processed Panax ginseng Products

Jae Won Lee 1,*, Seung-Heon Ji 1, Bo-Ram Choi 1, Doo Jin Choi 1, Yeong-Geun Lee 2, Hyo-Geun Kim 2, Geum-Soog Kim 1, Kyuil Kim 3, Youn-Hyung Lee 4, Nam-In Baek 2 and Dae Young Lee 1,*

1 Department of Herbal Crop Research, National Institute of Horticultural and Herbal Science, RDA, Eumseong 27709, Korea; jaewon3@gmail.com (J.W.L.); jiddung3936@gmail.com (S.-H.J.); bmcbr@korea.kr (B.-R.C.); cdj0105@korea.kr (D.J.C.); kimgs0725@korea.kr (G.-S.K.)
2 Department of Oriental Medicine Biotechnology, Kyung Hee University, Yongin 17104, Korea; lyg629@nate.com (Y.-G.L.); zwang05@naver.com (H.-G.K.); nibaek@khu.ac.kr (N.-I.B.)
3 Institute of JinAn Red Ginseng, JinAn 55442, Korea; redgin7@naver.com
4 Department of Horticultural Biotechnology, Kyung Hee University, Yongin 17104, Korea; younlee@khu.ac.kr
* Correspondence: dylee0809@korea.kr; Tel.: +82-43-871-5784; Fax: +82-43-871-5759

Received: 17 July 2018; Accepted: 14 August 2018; Published: 17 August 2018

Abstract: In the food industry and herbal markets, it is critical to control the quality of processed Panax ginseng products. In this study, ultra-performance liquid chromatography coupled to quadrupole time of flight mass spectrometry (UPLC-QTOF/MS)-based metabolomics was applied for the quality evaluation of white ginseng (WG), tae-geuk ginseng (TG), red ginseng (RG), and black ginseng (BG). Diverse metabolites including ginsenosides were profiled by UPLC-QTOF/MS, and the datasets of WG, TG, RG, and BG were then subjected to multivariate analyses. In principal component analysis (PCA), four processed ginseng products were well-differentiated, and several ginsenosides were identified as major components of each product. S-plot also characterized the metabolic changes between two processed ginseng products, and the major ginsenosides of each product were found as follows: WG (M-Rb1, M-Rb2, M-Rc, Re, Rg1), TG (Rb2, Rc, Rd, Re, Rg1), RG (Rb1, Rb2, Rc, Rd, Re, Rg1), and BG (Rd, Rk1, Rg5, Rg3). Furthermore, the quantitative contents of ginsenosides were evaluated from the four processed ginseng products. Finally, it was indicated that the proposed metabolomics approach was useful for the quality evaluation and control of processed ginseng products.

Keywords: metabolomics; UPLC-QTOF/MS; Panax ginseng; processed products; ginsenosides

1. Introduction

The root of Panax ginseng C.A. Meyer, one of the most critical herbal products in East Asia, has been widely used as ingredients for traditional medicines and functional foods [1,2]. Furthermore, not only raw ginseng but also several processed ginseng products have been used in the food industry and herbal markets [3]. According to the distinct processing methods, there are four processed P. ginseng products, white ginseng (WG), tae-geuk ginseng (TG), red ginseng (RG), and black ginseng (BG). Traditionally, WG is produced by dehydrating raw ginseng in sunlight, and TG is manufactured by heating up raw ginseng in 80–95 °C hot water for 20–25 min before drying [4,5]. In the production of RG, raw ginseng is steamed at 95–100 °C for 2–3 h, followed by dehydration [6]. BG is also manufactured by steaming WG for nine cycles at 95–100 °C, for 2–3 h [7,8]. These different methods change the composition of various metabolites in WG, TG, RG, and BG. Ginsenosides are known as
the major bioactive components of these ginseng products [9,10]. In particular, the qualitative and quantitative contents of ginsenosides differ depending on the distinct methods used to process raw ginseng [3,11,12]. Dehydration and steaming treatments can induce chemical changes in ginsenosides, which are converted to new bioactive compounds that are not present in raw ginseng [10,13]. For example, WG contains malonyl-ginsenosides (MGR), where a malonyl residue is linked to the glucose of the molecule, while the thermally unstable malonyl residue can be hydrolyzed by a steaming treatment to manufacture RG or BG [14]. Furthermore, BG contains specific ginsenosides, and exhibits more potent pharmacological effects than WG and RG [15]. A variety of ginsenosides have different bioactivities and clinical applications, such as anti-tumor, anti-diabetes, anti-oxidatives, etc. [16–18]. Hence, it is critical to assess the levels of ginsenosides for the quality control and effective usage of processed ginseng products.

In the last few decades, more than 150 different ginsenosides have been isolated and identified by nuclear magnetic resonance (NMR) spectroscopy [19,20]. Furthermore, many analytical methods such as high performance liquid chromatography (HPLC) coupled to UV detector [21,22], evaporative light scattering detector (ELSD) [7,23], or mass spectrometry (MS) [24,25] have been used to analyze various ginsenosides from the *P. ginseng* samples. In particular, ultra-performance LC coupled with quadrupole time of flight/MS (UPLC-QTOF/MS) has emerged as a fast and sensitive tool for the comprehensive profiling of ginsenosides [26,27]. A full mass scan mode using QTOF/MS is effective to explore various ginsenosides, as well as many other metabolites in complex mixtures [28]. Recently, for the holistic quality evaluation of processed ginseng products, metabolomics approaches based on UPLC-QTOF/MS have been used to profile various metabolites including ginsenosides [29,30]. Multivariate analyses are used, such as principal component analysis (PCA), which indicates whether any differences exist among samples, and orthogonal partial least squared discrimination analysis (OPLS-DA), which identifies which compounds have been altered for the quality evaluation of commercial WG and RG [30]. A well-constructed metabolomics approach combined with multivariate analyses will be useful for the quality evaluation of other processed ginseng products, such as TG and BG. Until now, many researchers have reported the analysis of WG and RG, whereas there are few studies on the metabolic components of TG and BG.

In this study, we applied the metabolomics approach based on UPLC-QTOF/MS to assess the metabolic compositions of WG, TG, RG, and BG. In the multivariate analyses, several ginsenosides were represented as major components to differentiate these four processed ginseng products. Furthermore, the qualitative and quantitative contents of ginsenosides were characterized for the quality evaluation of WG, TG, RG, and BG.

2. Results

2.1. Metabolite Profiling of Processed Ginseng Products by UPLC-QTOF/MS

UPLC-QTOF/MS with an in-house library, constructed in our previous study [31], was used to profile various metabolites, including ginsenosides, from four kinds of processed ginseng products (i.e., WG, TG, RG, and BG). 70% (v/v) methanol was used to extract ginsenosides and other metabolites from the four samples. Then, the extracts were subjected to UPLC-QTOF/MS in the negative ion mode. Figure 1 shows the representative base peak intensity (BPI) chromatograms of diverse metabolites from WG, TG, RG, and BG. UPLC separated various metabolites effectively in 30 min. The intensities of several peaks were different depending on the distinct samples. For example, compared to other products, BG showed a lower intensity of peaks eluted from 3 to 6 min, and a higher intensity of peaks eluted from 26 to 28 min in the BPI chromatogram. From 15 to 18 min, WG showed more peaks than other products. These demonstrated that different processing methods changed the metabolic composition of the distinct ginseng products.
2.2. Multivariate Analysis to Differentiate Four Processed Ginseng Products

Next, multivariate data analyses were performed to characterize in detail the distinct composition of various metabolites from WG, TG, RG, and BG. In the metabolite profiling of these four products, the numbers of individual samples were as follows: WG \((n = 10)\), TG \((n = 10)\), RG \((n = 10)\), and BG \((n = 10)\). After the UPLC-QTOF/MS-based profiling of individual samples, each dataset was processed using UNIFI software. All of the datasets were then subjected to PCA, to visualize the clustering trends among the four products. In the score plot, four groups of WG, TG, RG, and BG were well-differentiated (Figure 2A). Moreover, in the PCA loading plot, we identified the main variables that functioned to differentiate the four ginseng products in the score plot. Each point represented the \(m/z\)-retention time (RT) pairs of molecules. Based on an in-house library, 14 variables of the loading plot were identified, as well as several ginsenosides (Figure 2B).

OPLS-DA was also performed to discriminate between two selected samples as follows: WG vs. TG, WG vs. RG, WG vs. BG, TG vs. RG, TG vs. BG, and RG vs. BG. An S-plot analysis was then performed to select the critical variables that contributed to distinguish them. In the S-plot, each point showed \(m/z\)-RT pairs of molecules. First, OPLS-DA was performed to compare WG and the other three samples, respectively. In the comparison between WG and TG, the components elevated in WG were showed in the lower left quadrant of S-plot, while the upper right quadrant showed the components elevated in TG (Figure 3A). As a result, four ginsenosides (malonyl (M)-Rb1, M-Rb2, M-Rc, Re) were elevated in WG, while three ginsenosides (Rb2, Rc, Rd) and two unknown compounds were elevated in TG. In the S-plot of WG and RG, it was observed that three MGRs (M-Rb1, M-Rb2, M-Rc) were elevated in WG, while five ginsenosides (Rb1, Rb2, Rc, Rd, Rg1) were elevated in RG (Figure 3B). In the S-plot of WG and BG, five ginsenosides (M-Rb1, M-Rb2, M-Rc, Re, Rg1) were elevated in WG, while four ginsenosides (Rd, Rk1, Rg5, Rg3) were elevated in BG (Figure 3C). In comparison to other three products, WG showed three MGRs (M-Rb1, M-Rb2, M-Rc) as its major components.
Figure 2. (A) The principal component analysis (PCA) score plot and (B) loading plot of metabolic datasets of the four processed ginseng products including white ginseng (WG) ($n = 10$), tae-geuk ginseng (TG) ($n = 10$), red ginseng (RG) ($n = 10$), and black ginseng (BG) ($n = 10$). In the PCA loading plot, each point was identified as follows: ginsenoside (a) Rg3, (b) Rg5, (c) Rk1, (d) Rd, (e) Rc, (f) Rb2, (g) Rb1, (h) Rg1, (i) Re, (j) M-Rc, (k) M-Rb2, and (l) M-Rb1. $R^2_{X[1]} = 0.9443$ and $R^2_{X[2]} = 0.02803$. 
Figure 3. The S-plot of (A) white ginseng (WG) vs. tae-geuk ginseng (TG) ($R^2$: 96%, $Q^2$: 92%), (B) WG vs. red ginseng (RG) ($R^2$: 95%, $Q^2$: 92%), and (C) WG vs. black ginseng (BG) ($R^2$: 94%, $Q^2$: 91%).

Second, OPLS-DA was performed to differentiate TG vs. RG, TG vs. BG, and RG vs. BG, respectively. In the S-plot of TG and RG, five unknown compounds were elevated in TG, while four ginsenosides (Rd, Rg1, Rb1, Re) were elevated in RG (Figure 4A). In the S-plot of TG and BG, two ginsenosides (Rgl, Re) and one unknown compound were elevated in TG, while three ginsenosides (Rk1, Rg5, Rg3) were elevated in BG (Figure 4B). In the S-plot of RG and BG, three ginsenosides (Rg1, Re, Rb1) were elevated in RG, while three ginsenosides (Rk1, Rg5, Rg3) were elevated in BG (Figure 4C).
2.3. Quantification of Various Ginsenosides from Four Processed ginseng Products

As several ginsenosides were found to be key components for differentiating WG, TG, RG, and BG, it is essential to assess the levels of ginsenosides from each sample. UPLC-QTOF/MS with an in-house library was used to profile ginsenosides from 10 WGs, 10 TGs, 10 RGs, and 10 BGs. UNIFI software was then used to process the datasets of 40 individual samples. Using an in-house library, the numbers of identified ginsenosides from the four products were identified as follows: WG \((n = 26)\), TG \((n = 28)\), RG \((n = 34)\), and BG \((n = 36)\). On the basis of a standard curve, the quantification of ginsenosides was also performed in the individual samples. The quantification was based on 10 analyzed biological replicates for each product \((n = 10)\), and the values of the amounts were described as mean ± SD (Table 1).

Figure 4. The S-plot of (A) tae-geuk ginseng (TG) vs. red ginseng (RG) \((R^2: 92\%, Q^2: 89\%)\), (B) TG vs. black ginseng (BG) \((R^2: 96\%, Q^2: 95\%)\), and (C) RG vs. BG \((R^2: 94\%, Q^2: 89\%)\).
we applied the metabolomics approach to profile various metabolites and to statistically analyze the degree of heat treatment to produce the four ginseng products differs (WG < TG < RG < BG). 
P. ginseng individual sample. Samples having similar metabolic compositions were scattered close to each other, due to its function in the mass scan of whole ions. 
compounds, and QTOF/MS was effective for detecting various metabolites including ginsenosides, constructed method based on UPLC-QTOF/MS with an in-house library was used to profile various 
Molecules 2018 No. RT ± ± 
21 16.31 Ginsenoside Rb2 (Rb2) 0.8 
20 15.91 Malonyl ginsenoside Rc (M-Rc) 0.2 
19 15.67 Ginsenoside Re (Re) 0.1 
18 15.55 Ginsenoside Rb2 (Rb2) 0.1 
17 15.39 Ginsenoside Ra2 (Ra2) 0.1 
16 15.29 Ginsenoside Rb1 (Rb1) 0.1 
15 15.28 Ginsenoside Rg5 (Rg5) 0.1 
14 15.27 Ginsenoside Rg4 (Rg4) 0.1 
13 15.26 Ginsenoside Rg3 (Rg3) 0.1 
12 15.25 Ginsenoside Rg2 (Rg2) 0.1 
11 15.24 Ginsenoside Rg1 (Rg1) 0.1 
10 15.23 Ginsenoside Rf (Rf) 0.1 
9 15.22 Ginsenoside Rf1 (Rf1) 0.1 
8 15.21 Ginsenoside Re (Re) 0.1 
7 15.20 Ginsenoside Rd (Rd) 0.1 
6 15.19 Ginsenoside Rb1 (Rb1) 0.1 
5 15.18 Ginsenoside Ro (Ro) 0.1 
4 15.17 Ginsenoside Rb2 (Rb2) 0.1 
3 15.16 Ginsenoside Ra3 (Ra3) 0.1 
2 15.15 Ginsenoside Rb3 (Rb3) 0.1 
1 15.14 Ginsenoside Rb1 (Rb1) 0.1 

Second, multivariate analyses such as PCA and OPLS-DA were effectively used to distinguish and characterize the four processed ginseng products. First, the previously constructed method based on UPLC-QTOF/MS with an in-house library was used to profile various metabolites including ginsenosides. UPLC provided a fast and high-resolution separation of compounds, and QTOF/MS was effective for detecting various metabolites including ginsenosides, due to its function in the mass scan of whole ions.

Second, multivariate analyses such as PCA and OPLS-DA were effectively used to distinguish and characterize the four processed ginseng products. First, the previously constructed method based on UPLC-QTOF/MS with an in-house library was used to profile various metabolites including ginsenosides. UPLC provided a fast and high-resolution separation of compounds, and QTOF/MS was effective for detecting various metabolites including ginsenosides, due to its function in the mass scan of whole ions.

3. Discussion
As the processed ginseng products such as WG, TG, RG, and BG have been widely used in the herbal markets, it is critical to perform quality control on these products. For this, in this study, we applied the metabolomics approach to profile various metabolites and to statistically analyze the metabolic datasets for characterizing the four processed ginseng products. First, the previously constructed method based on UPLC-QTOF/MS with an in-house library was used to profile various metabolites including ginsenosides. UPLC provided a fast and high-resolution separation of compounds, and QTOF/MS was effective for detecting various metabolites including ginsenosides, due to its function in the mass scan of whole ions.

Second, multivariate analyses such as PCA and OPLS-DA were effectively used to distinguish and characterize the four processed ginseng products. In a PCA score plot, each point indicates an individual sample. Samples having similar metabolic compositions were scattered close to each other, whereas those having different metabolites were divided. The samples of WG, TG, RG, and BG were well differentiated, and this means that each product has a distinct metabolic composition. WG, TG, RG, and BG were also scattered in order from the right side to the left side. In the processing of P. ginseng, the degree of heat treatment to produce the four ginseng products differs (WG < TG < RG < BG).
Hence, the metabolic alteration of four ginseng products might be related to the degree of heat treatment. Furthermore, in the PCA loading plot, several ginsenosides were mainly identified as critical variables to differentiate the four ginseng products. This indicated that the ginsenoside contents were mainly affected by the processing methods, including hydration and heat treatment.

Next, in the OPLS-DA and S-plot, the different compositions of metabolites were distinguished between the two selected samples. In the S-plot, the points of the metabolites that greatly contributed to the variance between two groups, were plotted the farther along the x-axis and y-axis. These results showed that several ginsenosides were found to be the main characteristic components of each product. From the data of the S-plot, we identified the characteristic components, which were generally present in the four ginseng products, as follows: WG (M-Rb1, M-Rb2, M-Rc, Re, Rg1), TG (Rb2, Rc, Rd, Re, Rg1, unknown compounds), RG (Rb1, Rb2, Rc, Rd, Re, Rg1), and BG (Rd, Rk1, Rg5, Rg3). Among these processed ginseng products, WG had three MGRs such as M-Rb1, M-Rb2, and M-Rc as its main components. The malonyl residue, which is linked to the glucose in MGRs, is thermally unstable and it easily hydrolyzed by steaming treatment. As WG is manufactured by dehydration in sunlight and with no heat treatment, MGRs are well preserved in WG, compared to other products. Finally, ginsenoside contents were mainly different according to the type of ginseng product analyzed. Hence, it is critical to identify and quantify ginsenosides in order to evaluate the quality of WG, TG, RG, and BG.

By using an in-house library, a number of ginsenosides were identified as follows: WG (n = 26), TG (n = 28), RG (n = 34), and BG (n = 36). Furthermore, Table 1 represents the quantitative data of these ginsenosides. Above all, we focused on the ginsenosides that were identified as the main components of each product in the S-plot. For the quantification of three MGRs (M-Rb1, M-Rb2, M-Rc) found as main components of WG, it was necessary to use MGR standards. However, commercially obtaining the MGR standard samples was difficult, due to its thermal weakness and difficulty of separation. Thus, in our laboratory, we isolated these MGRs by ourselves, and quantified them in each sample. In the S-plots of TG, five ginsenosides (Rd, Rc, Rb2, Re, Rg1) were found as its main components. However, RG and BG had higher amounts of these ginsenosides than TG. Hence, they were relative markers for their differentiation from other samples. From the quantification, RG had the highest levels of the five ginsenosides (Rg1, Re, Rb1, Rb2, Rc) found in the S-plots, and of other ginsenosides (gRf, nR2, nR2-R, Rf, Rb3). BG also had the highest levels of the three ginsenosides (Rk1, Rg5, Rg3) found in the S-plots. As these ginsenosides have various pharmaceutical properties, the profiling of ginsenosides should be performed to determine the pharmacological utility of each ginseng product. For instance, TG and RG could display various properties such as anti-cancer (Rc, Rb2), anti-diabetes (Rd, Rb2, Re), and anti-inflammatory (Rd, Rb2, Re, Rg1) [17,32–35]. Furthermore, Rk1, Rg5, and Rg3, which mainly exist in BG, could display the activities of platelet anti-aggregating, anti-inflammation, and anti-cancer [36–39]. BG had the highest number of ginsenosides among the four ginseng products, and it had five unique ginsenosides (CK, CY, Rh2, Rk2, Rh3). CK, which is known as the metabolite of Rb1, has anti-cancer [40], anti-inflammatory, and hepatoprotective effects [41]. Although other ginsenosides such as Rh2 and Rh3 showed anti-cancer and anti-inflammatory effects [42], there were still no reports on the biological activity of CK and Rh2. In further studies, to characterize in detail the properties of processed ginseng products, quantification of high- or low-abundance ginsenosides is required, as well as isolation and application of specific ginsenosides to find the biological activity.

4. Materials and Methods

4.1. Standard Constituents and Reagents

HPLC-grade methanol, water, and acetonitrile were purchased from Fisher Scientific Korea (Seoul, Korea). HPLC-grade formic acid was purchased from Fluka Chemie GmbH (Buchs, Switzerland). The ginsenoside standards used in this study were commercially obtained or isolated and purified from P. ginseng roots and red ginseng by a series of chromatography procedures,
such as silica gel or octadecyl silica gel (ODS) column chromatographies, and the medium-pressure liquid chromatography (MPLC) in our laboratory. The information for 58 ginsenosides has been reported in our previous study [31]. We used these standards for the quality control analysis and the quantification of ginsenosides.

4.2. Processed Panax ginseng Samples

All processed ginseng products were made from five-year-old raw Panax ginseng grown in the JinAn, Jeonbuk province (latitude 35°5′ N, longitude 127°45′ E). White ginseng was prepared by washing peeled fresh ginseng and drying it in hot wind or sunlight. Taeguk ginseng was prepared by first washing the fresh ginseng, and then steaming it for 30 min at 80–90 °C, followed by drying in hot wind and sunlight. The red ginseng was produced by steaming the non-peeled fresh roots of ginseng at 90–95 °C for 3 h and then drying them. Black ginseng was manufactured by triple steaming of the white ginseng at 95–98 °C for 3–5 h in a pottery apparatus, followed by drying at 50 °C for 24 h (Figure 5).

4.3. Sample Preparation

Processed white, Taeguk, red, and black ginseng roots of similar size were selected, and the main and lateral roots were used for experiments after removing the fine roots. The main and lateral roots with average diameters of 2.1 to 2.5 cm, 0.6 to 1.1 cm, respectively, were selected. A mixer (Hanil, Seoul, Korea) was used to grind each sample (<0.5 mm) and the sample was thoroughly mixed; a Retsch MM400 mixer mill (Retsch GmbH, Haan, Germany) was then used to homogenize further subsamples. Fine powder (200 mg) from each sample was suspended in 2 mL of 70% (v/v) methanol, and ultrasonically extracted for 30 min at 50 °C. After centrifugation (13,500 rpm, 5 min), the solution was filtered by using a syringe filter (0.22 μm) and injected into the UPLC system.

Figure 5. The scheme of producing four processed P. ginseng products: white ginseng, tae-geuk ginseng, red ginseng, and black ginseng.
4.4. UPLC-QTOF/MS Conditions

For metabolite profiling of the processed ginseng products, we used a previously constructed method based on UPLC-QTOF/MS [31]. UPLC analysis was performed by using a Waters ACQUITY H-Class UPLC (Waters Corp., Milford, MA, USA), and the used column was an ACQUITY BEH C18 column (2.1 mm × 100 mm, 1.7 µm). The temperatures of the column oven and the sample tray were maintained at 40 and 4 °C, respectively. The mobile phase consisted of solvent A (water:formic acid = 100:0.1, v/v) and solvent B (acetonitrile:formic acid = 100:0.1, v/v). The gradient elution program was as follows: 0–0.5 min, A 85%; 0.5–1 min, A 85–80%; 1–6 min, A 80%; 6–13 min, A 80–70%; 13–23 min, A 70–65%; 23–24 min, A 65–62%; 24–27 min, A 62–40%; 27–31 min, A 40–10%; 31–32 min, A 10–85%; 32–35 min, A 85%. The flow rate was set at 0.4 mL/min, and the sample injection volume was 2 µL for each run. Next, the TOF MS experiments were performed by using a Waters Xevo G2-S QTOF MS (Waters Corp., Milford, MA, USA). The mass spectrometers performed alternative high- and low-energy scans known as the MS² acquisition mode. The high-accuracy MS data were collected from m/z 100–2500 Da in negative ion mode. The cone voltage and capillary voltage were 40V and 3.0 kV, respectively. The source and desolvation temperatures were 120 °C and 550 °C, respectively. The cone gas flow and desolvation gas flows were 30 L/h and 800 L/h, respectively. To ensure the mass accuracy and reproducibility of MS condition, a lock spray with leucine-enkephalin (200 pg/mL, 10 µL/min) was used as the reference (m/z 554.262 (ESI−)). For the quality control sample analysis, a standard of Ginsenoside F1 was injected after every analysis of five samples. The precision of LC/MS analysis was determined by a coefficient of variation (CV) for RT (0.1%) and peak intensity (7.9%).

4.5. Data Processing and Multivariate Analysis

MS² data were collected and processed using the apex peak detection and alignment algorithms in UNIFI 1.8 (Waters Corp., Milford, MA, USA). The intensity of each ion was normalized by the total ion count to generate a data matrix having RT, m/z value, and the normalized peak area. Charged species, salt adducts, and fragments were automatically aligned and grouped. The three-dimensional data, including peak number (RT-m/z pair), normalized peak areas, and sample name, were then exported to EZinfo software 3.0.3 (UMETRICS) for multivariate analyses such as PCA and OPLS-DA. The data were mean-centered and pareto-scaled before PCA and OPLS-DA.

5. Conclusions

This study is the first to report the application of an optimal UPLC-QTOF/MS-based metabolomics for the quality evaluation of four processed ginseng products. Multivariate analyses differentiated the metabolic datasets of WG, TG, RG, and BG, and various ginsenosides were found as the characteristic components of each product. As each ginsenoside has specific activities, the ginsenosides profiling can be applied to assess the pharmacological utility of not only ginseng roots, but also processed ginseng products. According to the processing methods that are used to produce WG, TG, RG, and BG, their metabolic composition may change. This information will be useful to optimize the protocol for manufacturing each type of processed ginseng product in the food industry or the herbal medicine market. Finally, this study demonstrated the utility of metabolomics approach for the quality evaluation and control of processed ginseng products. In future, this method will be useful for evaluating processed ginseng products manufactured by using not only the root, but also other parts such as the leaf, stem, and berry.

Author Contributions: J.W.L. and D.Y.L. conceived and designed the experiments; B.-R.C. and S.-H.J. performed the TOF-mass spectrometry of the samples; D.J.C. and G.-S.K. producing four processed P. ginseng products; Y.-G.L. and H.-G.K. isolated the standard compounds and elucidated the structures; K.K. and Y.H.L. contributed to the plant materials preparation; J.W.L. and D.Y.L. wrote the paper, and N.I.B. managed the research project.

Acknowledgments: This work was supported by the Agro-Bio industry Technology Development Program (318013-02-1-HD020), Ministry of Agriculture, Food and Rural Affairs, Korea.
Conflicts of Interest: The authors declare no conflict of interest.

Abbreviations

UPLC Ultra-performance liquid chromatography  
QTOF Quadrupole time of flight  
ESI Electrospray ionization  
MS Mass spectrometry  
LOD Limits of detection  
RT Retention time

References

1. Jang, H.-J.; Han, I.-H.; Kim, Y.-J.; Yamabe, N.; Lee, D.; Hwang, G.S.; Oh, M.; Choi, K.-C.; Kim, S.-N.; Ham, J. Anticarcinogenic effects of products of heat-processed ginsenoside Re, a major constituent of ginseng berry, on human gastric cancer cells. *J. Agric. Food Chem.* **2014**, *62*, 2830–2836. [CrossRef] [PubMed]
2. Li, X.; Yan, Y.Z.; Jin, X.; Kim, Y.K.; Uddin, M.R.; Kim, Y.B.; Bae, H.; Kim, Y.C.; Lee, S.W.; Park, S.U. Ginsenoside content in the leaves and roots of *Panax ginseng* at different ages. *Life Sci. J.* **2012**, *9*, 670–683.
3. Lee, S.-R.; Kim, M.-R.; Yon, J.-M.; Baek, I.-J.; Park, C.G.; Lee, B.J.; Yun, Y.W.; Nam, S.-Y. Black ginseng inhibits ethanol-induced teratogenesis in cultured mouse embryos through its effects on antioxidant activity. *Toxicol. In Vitro* **2009**, *23*, 47–52. [CrossRef] [PubMed]
4. Ning, X.; Han, C. Suitable drying model for far infrared drying of taegeuk ginseng. *Food Sci. Biotechnol.* **2012**, *21*, 1087–1094. [CrossRef]
5. Ning, X.; Han, C. Drying characteristics and quality of taegeuk ginseng (*Panax ginseng CA Meyer*) using far-infrared rays. *Int. J. Food Sci. Technol.* **2013**, *48*, 477–483. [CrossRef]
6. Zhang, H.-M.; Li, S.-L.; Zhang, H.; Wang, Y.; Zhao, Z.-L.; Chen, S.-L.; Xu, H.-X. Holistic quality evaluation of commercial white and red ginseng using a UPLC-QTOF-MS/MS-based metabolomics approach. *J. Pharm. Biomed. Anal.* **2012**, *62*, 258–273. [CrossRef] [PubMed]
7. Sun, B.-S.; Gu, L.-J.; Fang, Z.-M.; Wang, C.-Y.; Wang, Z.; Lee, M.-R.; Li, Z.; Li, J.-J.; Sung, C.-K. Simultaneous quantification of 19 ginsenosides in black ginseng developed from *Panax ginseng* by HPLC–ELSD. *J. Pharm. Biomed. Anal.* **2009**, *50*, 15–22. [CrossRef] [PubMed]
8. Sun, B.-S.; Gu, L.-J.; Fang, Z.-M.; Wang, C.Y.; Wang, Z.; Sung, C.-K. Determination of 11 ginsenosides in black ginseng developed from *Panax ginseng* by high performance liquid chromatography. *Food Sci. Biotechnol.* **2009**, *18*, 561–564.
9. Lee, H.; Park, D.; Yoon, M. Korean red ginseng (*Panax ginseng*) prevents obesity by inhibiting angiogenesis in high fat diet-induced obese C57BL/6J mice. *Food Chem. Toxicol.* **2013**, *53*, 402–408. [CrossRef] [PubMed]
10. Xie, Y.; Luo, D.; Cheng, Y.; Ma, J.-F.; Wang, Y.; Liang, Q.; Luo, G. Steaming-induced chemical transformations and holistic quality assessment of red ginseng derived from *Panax ginseng* by means of HPLC-ESI-MS/MS n-based multicomponent quantification fingerprint. *J. Agric. Food Chem.* **2012**, *60*, 8213–8224. [CrossRef] [PubMed]
11. Lee, S.A.; Jo, H.K.; Im, B.O.; Kim, S.; Whang, W.K.; Ko, S.K. Changes in the contents of prosapogenin in the red ginseng (*Panax ginseng*) depending on steaming batches. *J. Ginseng Res.* **2012**, *36*, 102. [CrossRef] [PubMed]
12. Chung, I.-M.; Kim, J.-W.; Seguin, P.; Jun, Y.-M.; Kim, S.-H. Ginsenosides and phenolics in fresh and processed Korean ginseng (*Panax ginseng CA Meyer*): Effects of cultivation location, year, and storage period. *Food Chem.* **2012**, *130*, 73–83. [CrossRef]
13. Kim, S.N.; Ha, Y.W.; Shin, H.; Son, S.H.; Wu, S.J.; Kim, Y.S. Simultaneous quantification of 14 ginsenosides in *Panax ginseng CA Meyer* (Korean red ginseng) by HPLC-ELSD and its application to quality control. *J. Pharm. Biomed. Anal.* **2007**, *45*, 164–170. [CrossRef] [PubMed]
14. Cha, J.-Y.; Park, E.-Y.; Kim, H.-J.; Park, S.-U.; Nam, K.-Y.; Choi, J.-E.; Jun, H.-S. Effect of white, taegeuk, and red ginseng root extracts on insulin-stimulated glucose uptake in muscle cells and proliferation of β-cells. *J. Ginseng Res.* **2010**, *34*, 192–197. [CrossRef]
15. Kim, S.-J.; Kim, A.K. Anti-breast cancer activity of Fine Black ginseng (*Panax ginseng Meyer*) and ginsenoside Rg5. *J. Ginseng Res.* **2015**, *39*, 125–134. [CrossRef] [PubMed]
16. Xie, J.-T.; Mehendale, S.R.; Li, X.; Quigg, R.; Wang, X.; Wang, C.-Z.; Wu, J.A.; Aung, H.H.; Rue, P.A.; Bell, G.I. Anti-diabetic effect of ginsenoside Re in ob/ob mice. *Biochim Biophys. Acta Mol. Basis Dis.* **2005**, *1740*, 319–325. [CrossRef] [PubMed]

17. Yue, P.Y.K.; Mak, N.K.; Cheng, Y.K.; Leung, K.W.; Ng, T.B.; Fan, D.T.P.; Yeung, H.W.; Wong, R.N.S. Pharmacogenomics and the Yin/Yang actions of ginseng: Anti-tumor, angiomodulating and steroid-like activities of ginsenosides. *Chin. Med.* **2007**, *2*, 6. [CrossRef] [PubMed]

18. Shao, Z.-H.; Xie, J.-T.; Hoek, T.L.V.; Mehendale, S.; Aung, H.; Li, C.-Q.; Qin, Y.; Schumacker, P.T.; Becker, L.B.; Yuan, C.-S. Antioxidant effects of American ginseng berry extract in cardiomyocytes exposed to acute oxidant stress. *Biochim. Biophys. Acta Acta General Subj.* **2004**, *1670*, 165–171. [CrossRef] [PubMed]

19. Shin, B.-K.; Kwon, S.W.; Park, J.H. Chemical diversity of ginseng saponins from *Panax ginseng*. *J. Ginseng Res.* **2015**, *39*, 287–298. [CrossRef] [PubMed]

20. Yang, W.-Z.; Hu, Y.; Wu, W.-Y.; Ye, M.; Guo, D.-A. Saponins in the genus Panax L. (Araliaceae): A systematic review of their chemical diversity. *Phytochemistry* **2014**, *106*, 7–24. [CrossRef] [PubMed]

21. Morinaga, O.; Uto, T.; Yuan, C.-S.; Tanaka, H.; Shoyama, Y. Evaluation of a new eastern blotting technique with different growth ages using high-performance liquid chromatography–mass spectrometry. *J. Chromatogr. A* **2015**, *1902*, 329–336. [CrossRef] [PubMed]

22. Wang, C.-Z.; Wu, J.A.; McEntee, E.; Yuan, C.-S. Saponins composition in American ginseng leaf and berry assayed by high-performance liquid chromatography. *J. Agric. Food Chem.* **2006**, *54*, 2261–2266. [CrossRef] [PubMed]

23. Van Le, T.H.; Lee, S.Y.; Lee, G.J.; Nguyen, N.K.; Park, J.H.; Nguyen, M.D. Effects of steaming on saponin compositions and antiproliferative activity of Vietnamese ginseng. *J. Ginseng Res.* **2015**, *39*, 274–278.

24. Kim, S.; Shin, B.-K.; Lim, D.K.; Yang, T.-J.; Lim, J.; Park, J.H.; Kwon, S.W. Expeditious discrimination of four species of the Panax genus using direct infusion MS/MS combined with multivariate statistical analysis. *J. Chromatogr. B* **2015**, *1002*, 329–336. [CrossRef] [PubMed]

25. Wang, Y.; Pan, J.Y.; Xiao, X.Y.; Lin, R.C.; Cheng, Y.Y. Simultaneous determination of ginsenosides in *Panax ginseng* with different growth ages using high-performance liquid chromatography–mass spectrometry. *Phytochem. Anal.* **2006**, *17*, 424–430. [CrossRef] [PubMed]

26. Mao, Q.; Bai, M.; Xu, J.-D.; Kong, M.; Zhu, L.-Y.; Zhu, H.; Wang, Q.; Li, S.-L. Discrimination of leaves of *Panax ginseng* and *P. quinquefolius* by ultra high performance liquid chromatography quadrupole/time-of-flight mass spectrometry based metabolomics approach. *J. Pharm. Biomed. Anal.* **2014**, *97*, 129–140. [CrossRef] [PubMed]

27. Song, H.-H.; Moon, J.Y.; Ryu, H.W.; Noh, B.-S.; Kim, J.-H.; Lee, H.-K.; Oh, S.-R. Discrimination of white ginseng origins using multivariate statistical analysis of data sets. *J. Ginseng Res.* **2014**, *38*, 187–193. [CrossRef] [PubMed]

28. Xie, G.X.; Ni, Y.; Su, M.M.; Zhang, Y.Y.; Zhao, A.H.; Gao, X.F.; Liu, Z.; Xiao, P.G.; Jia, W. Application of ultra-performance LC-TOF MS metabolite profiling techniques to the analysis of medicinal Panax herbs. *Metabolomics* **2008**, *4*, 248–256. [CrossRef]

29. Wan, J.-Y.; Liu, P.; Wang, H.-Y.; Qi, L.-W.; Wang, C.-Z.; Li, P.; Yuan, C.-S. Biotransformation and metabolic profile of American ginseng saponins with human intestinal microflora by liquid chromatography quadrupole time-of-flight mass spectrometry. *J. Chromatogr. A* **2013**, *1306*, 83–92. [CrossRef] [PubMed]

30. Park, H.-W.; In, G.; Kim, J.-H.; Cho, B.-G.; Han, G.-H.; Chang, I.-M. Metabolomic approach for discrimination of processed ginseng genus (*Panax ginseng* and *Panax quinquefolius*) using UPLC-QTOF MS. *J. Ginseng Res.* **2014**, *38*, 59–65. [CrossRef] [PubMed]

31. Lee, J.W.; Choi, B.-R.; Kim, Y.-C.; Choi, D.J.; Lee, Y.-S.; Kim, G.-S.; Baek, N.-I.; Kim, S.-Y.; Lee, D.Y. Comprehensive Profiling and Quantification of Ginsenosides in the Root, Stem, Leaf, and Berry of *Panax ginseng* by UPLC-QTOF/MS. *Molecules* **2017**, *22*, 2147. [CrossRef] [PubMed]

32. Kenarova, B.; Neychev, H.; Hadjiivanova, C.; Petkov, V.D. Immunomodulating activity of ginsenoside Rg1 from *Panax ginseng*. *Jpn. J. Pharmacol.* **1990**, *54*, 447–454. [CrossRef] [PubMed]

33. Attele, A.S.; Zhou, Y.-P.; Xie, J.-T.; Wu, J.A.; Zhang, L.; Dey, L.; Pugh, W.; Rue, P.A.; Polonsky, K.S.; Yuan, C.-S. Antidiabetic effects of *Panax ginseng* berry extract and the identification of an effective component. *Diabetes* **2002**, *51*, 1851–1858. [CrossRef] [PubMed]
34. Kim, C.-K.; Cho, D.H.; Lee, K.-S.; Lee, D.-K.; Park, C.-W.; Kim, W.G.; Lee, S.J.; Ha, K.-S.; Goo Taeg, O.; Kwon, Y.-G. Ginseng berry extract prevents atherogenesis via anti-inflammatory action by upregulating phase II gene expression. *Evid.-Based Complement. Altern. Med.*** 2012, 2012. [CrossRef] [PubMed]

35. Shan, S.-M.; Luo, J.-G.; Huang, F.; Kong, L.-Y. Chemical characteristics combined with bioactivity for comprehensive evaluation of *Panax ginseng* CA Meyer in different ages and seasons based on HPLC-DAD and chemometric methods. *J. Pharm. Biomed. Anal.* **2014**, *89*, 76–82. [CrossRef] [PubMed]

36. Jiang, J.; Yuan, Z.; Sun, Y.; Bu, Y.; Li, W.; Fei, Z. Ginsenoside Rg3 enhances the anti-proliferative activity of erlotinib in pancreatic cancer cell lines by downregulation of EGFR/PI3K/Akt signaling pathway. *Biomed. Pharmacother.* **2017**, *96*, 619–625. [CrossRef] [PubMed]

37. Junmin, S.; Hongxiang, L.; Zhen, L.; Chao, Y.; Chaojie, W. Ginsenoside Rg3 inhibits colon cancer cell migration by suppressing nuclear factor kappa B activity. *J. Tradit. Chin. Med.* **2015**, *35*, 440–444. [CrossRef]

38. Lee, J.G.; Lee, Y.Y.; Kim, S.Y.; Pyo, J.S.; Yun-Choi, H.S.; Park, J.H. Platelet antiaggregating activity of ginsenosides isolated from processed ginseng. *Die Pharm. Int. J. Pharmacol. Sci.* **2009**, *64*, 602–604.

39. Kim, J.H.; Yi, Y.-S.; Kim, M.-Y.; Cho, J.Y. Role of ginsenosides, the main active components of *Panax ginseng*, in inflammatory responses and diseases. *J. Ginseng Res.* **2017**, *41*, 435–443. [CrossRef] [PubMed]

40. Kim, D.Y.; Park, M.W.; Yuan, H.D.; Lee, H.J.; Kim, S.H.; Chung, S.H. Compound K induces apoptosis via CAMK-IV/AMPK pathways in HT-29 colon cancer cells. *J. Agric. Food Chem.* **2009**, *57*, 10573–10578. [CrossRef] [PubMed]

41. Park, J.-S.; Shin, J.A.; Jung, J.-S.; Hyun, J-W.; Van Le, T.K.; Kim, D.-H.; Park, E.-M.; Kim, H.-S. Anti-inflammatory mechanism of compound K in activated microglia and its neuroprotective effect on experimental stroke in mice. *J. Pharmacol. Exp. Ther.* **2012**, *341*, 59–67. [CrossRef] [PubMed]

42. Lee, H.U.; Bae, E.A.; Han, M.J.; Kim, N.J.; Kim, D.H. Hepatoprotective effect of ginsenoside Rb1 and compound K on tert-butyl hydroperoxide-induced liver injury. *Liver Int.* **2005**, *25*, 1069–1073. [CrossRef] [PubMed]

Sample Availability: Samples of the compounds are not available from the authors.