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# Research article

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# Analysis of metabolic differences between Jiaosu fermented from dendrobium flowers and stems based on untargeted metabolomics

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#### ABSTRACT

Dendrobium officinale is an important traditional Chinese medicinal herb containing bioactive polysaccharides and alkaloids. This study characterized metabolite differences between jiaosu (fermented plant product) from Dendrobium flowers versus stems using untargeted metabolomics. The jiaosu was fermented by mixed fermentation of *Saccharomyces cerevisiae*, Lactobacillus bulgaricus and Streptococcus thermophilus. Liquid chromatography-mass spectrometry analysis identified 476 differentially expressed metabolites between the two Jiaosu products. Key results showed downregulation of flavonoid metabolism in Dendrobium Stems Edible Plant Jiaosu (SEP) but increased flavonoid synthesis in Dendrobium Flowers Edible Plant Jiaosu (FEP), likely an antioxidant response. SEP displayed upregulation of lignin metabolites with potential antioxidant properties. The findings demonstrate significant metabolite profile differences between see SEP and FEP, providing the basis for developing functional jiaosu products targeting specific health benefits.

# 1. Introduction

Dendrobium officinale Kimura et Migo, a member of the Orchidaceae family, primarily comprises polysaccharides and contains polyphenols, flavonoids, alkaloids, amino acids, and vitamins [1,2]. Recent pharmacological research has shown that Dendrobium, including its polysaccharide component, provides various health benefits, including protection against cancer and liver damage and reducing blood cholesterol, triglyceride levels, and blood pressure [3,4].

The edible plant Jiaosu (EPJ), or fermented juice, is produced by fermenting various vegetables, fruits, grains, seaweeds, and mushrooms with naturally occurring or added bacteria or yeast [5]. Currently, natural fermentation is the primary method used in the manufacturing of EPJ [6]. While natural fermentation is a cost-effective and straightforward process, it presents challenges such as a more complex microflora, a longer fermentation cycle, unknown changes in active chemicals, and difficulties in quality monitoring. Using artificial inoculation for strain determination can effectively address the limitations associated with the prolonged and unpredictable natural fermentation of EPJ. This approach leads to a more regulated fermentation process and improved nutrient composition. According to Lee et al. [7], the fermentation of papaya juice with a combination of *S. cerevisiae* and W. saturnus strains resulted in the generation of more complex fragrance compounds and elevated ethanol levels, in contrast to papaya juice fermented

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with a single yeast strain.

Untargeted metabolomics involves the thorough examination of both known and unknown metabolites within a biological system without any predetermined assumptions. Liquid chromatography combined with mass spectrometry (LC-MS) is widely utilized as an analytical method for untargeted metabolomic studies, enabling the comprehensive analysis of microbial metabolism on a global level [8]. There needs to be more scholarly investigation into the metabolic byproducts of EPJ in the realm of metabolomics, resulting in a lack of comprehensive knowledge regarding the specific metabolites and metabolic pathways that contribute to the advantageous effects of EPJ. Consequently, scientific interest is in characterizing the fermentation processes associated with these products.

Most of the current Dendrobium EPJ is produced through the fermentation of Dendrobium stems as the primary raw material. In a study by L. Jiang et al. [9], Dendrobium huoshanense was used as the raw material to examine the active ingredients and in vitro antioxidant capacity of Dendrobium EPJ during fermentation. Furthermore, Dendrobium flowers contain diverse bioactive compounds, such as naringenin, anthocyanins, polysaccharides, amino acids, and dendrobium alkaloids. These compounds demonstrate antioxidant, hepatoprotective, hypoglycemic, and hypotensive effects [10]. Nevertheless, there is limited research on the Dendrobium flower EPJ. Meanwhile, most research on Dendrobium EPJ has focused solely on quantifying specific metabolites and antioxidant capacity [11]. However, comprehensive information regarding metabolites and specific antioxidants in Dendrobium EPJ remains unclear.

The objective of this study was to analyze the evolving metabolomics of Dendrobium stem EPJ and Dendrobium floral EPJ and to identify significant differential metabolites, as well as potential anti-inflammatory and antioxidant compounds linked to these two distinct EPJ production pathways through artificial inoculation. To establish a foundation for the food industry to develop various Dendrobium EPJ products tailored to diverse health benefits and consumer demands. The metabolomic analysis was conducted using liquid chromatography and mass spectrometry (LC-MS).

#### 2. Materials and methods

# 2.1. Chemicals and material

Methanol (HPLC grade) and acetonitrile (HPLC grade) were purchased from ThermoFisher Scientific, Co., Ltd. (USA). Formic acid were purchased from CNW Technologies, Co., Ltd. (China). Isopropanol (HPLC grade) was purchased from Merck & Co., Inc. (USA). Dendrobium flowers and Dendrobium stems were purchased from Huoshan County Agricultural Market.

#### 2.2. Preparation of dendrobium stem EPJ samples and dendrobium flower EPJ samples

Dendrobium Stems Edible Plant Jiaosu (SEP) and Dendrobium Flowers Edible Plant Jiaosu (FEP) were produced following the protocol described by Jiang et al. with modifications [5]. Cleanse 100g of both dendrobium flowers and stems with sterile water to remove surface dust, and then chop them into  $\sim$ 5 mm  $\times$  5 mm pieces using sterile scissors. Sterilize them using UV light for 45 min, flipping and repeating this process two to three times to ensure adequate sterilization. Combine the sterilized dendrobium flower/stem powder with the sterilized fermentation vessel, and then add the autoclaved sucrose solution in a ratio of 1:1:6 (dendrobium flower/stem powder: sucrose solution: water). Next, add 1% of the prepared fermenting agent consisting of *Saccharomyces cerevisiae*, Lactobacillus bulgaricus, and Streptococcus thermophilus in a ratio of 2:1:1 to the two groups of fermenters. Seal the fermenters and ferment at 37 °C for 21 days. After fermentation, extract six 5 mL samples of EPJ from dendrobium flowers and label them FEP 1, FEP2, ..., FEP6. Similarly, obtain six 5 mL samples of EPJ from dendrobium stems and designate them SEP 1, SEP2, ..., SEP6. Test using the two sets of 12 samples, and store the remaining EPJ in a refrigerator at -20 °C.

#### 2.3. Metabolite extraction for LC-MS analysis

Extract 100  $\mu$ l of EPJ samples from Dendrobium stems or flowers using a 1:1 (v/v) mixture of methanol and acetonitrile (400  $\mu$ L). Subsequently, sonicate the mixture for 30 min at 40 kHz and 5 °C. Precipitate the proteins by storing the samples at -20 °C for 30 min. Transfer the supernatant to fresh microtubes and evaporate it to dryness using a gentle stream of nitrogen after centrifuging at 13000g at 4 °C for 15 min. Reconstitute the samples for UHPLC-MS/MS analysis using brief sonication in a 5 °C water bath with 100  $\mu$ L of loading solution of acetonitrile and water (1:1, v/v).

#### 2.4. Quality control sample

As a part of the system conditioning and quality control process, a pooled quality control sample (QC) was prepared by mixing equal volumes of all samples. The QC samples were disposed of and tested in the same manner as the analytic samples. It helped to represent the whole sample set, which would be injected at regular intervals (every 4 samples) to monitor the stability of the analysis.

#### 2.5. (UHPLC-MS/MS) analysis

The instrument platform for LC-MS analysis is a Thermo Fisher Scientific UHPLC-Q Exactive system.

#### 2.5.1. Chromatographic states

 $2 \ \mu$ L of the sample was separated using an HSS T3 column (100 mm 2.1 mm i.d., 1.8), and then mass spectrometry detection was performed. (Solvent A) and 0.1% formic acid in acetonitrile: isopropanol: water (Solvent B). For equilibrating the systems, the solvent gradient changed as follows: from 0 to 0.1 min, 0% B to 5% B; from 0.1 to 2 min, 5% B to 25% B; from 2 to 9 min, 25% B to 100% B; from 9 to 13 min, 100% B to 100% B; from 13 to 13.1 min, 100% B to 0% B; and from 13.1 to 16 min, 0% B to 0% B. The injection volume of the sample was two  $\mu$ L, and the flow rate was set to 0.4 mL/min. The column temperature was kept at 40 °C. During the analysis period, these samples were all stored at 4 °C.

### 2.5.2. MS conditions

The mass spectrometric data was gathered using a Thermo UHPLC-Q Exactive Mass Spectrometer with an electrospray ionization (ESI) source operating in either positive or negative ion mode. The ideal conditions were established as follows: 400 °C heater temperature;

Sheath gas flow rate, 40 arb; Aux gas flow rate, 10 arb; ion-spray voltage floating (ISVF), -2800V in negative mode and 3500V in positive mode, respectively. Normalized collision energy, rolling at 20-40-60V for MS/MS. The total MS resolution was 70,000, while

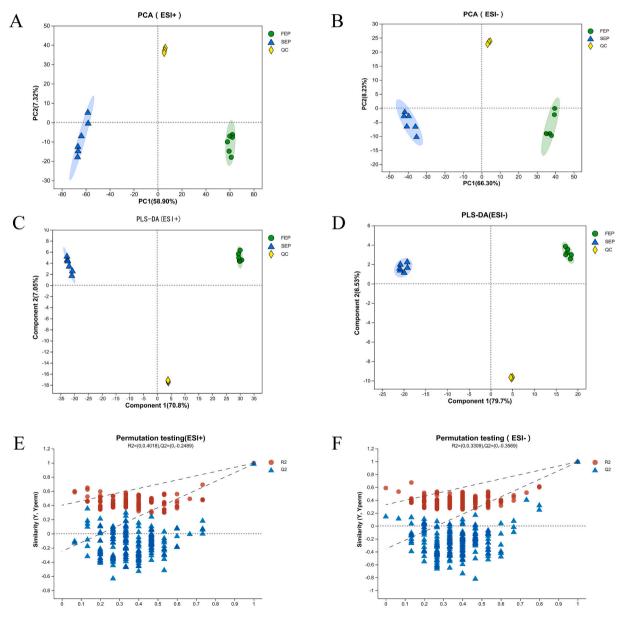
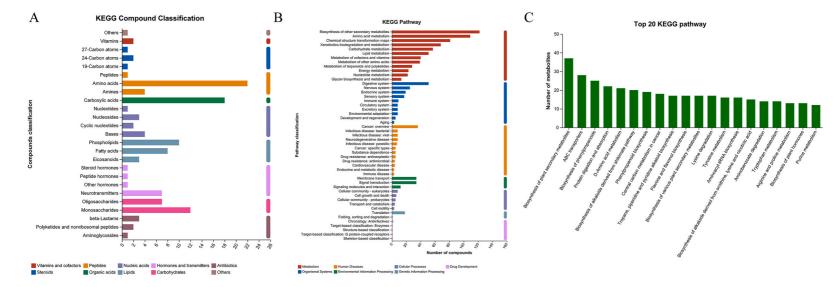


Fig. 1. PCA score plots, PLS-DA score plots and replacement test plots of all samples in the positive ionization mode (A/C/E) and negative ionization mode (B/D/F).



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Fig. 2. Based on the identification of all metabolites by mass spectrometry, the metabolites were compared with KEGG to obtain the statistics of compound classification in the database (2A), the related pathways (2B) and the statistics of the top 20 significant pathways (2C).

the MS/MS resolution was 17,500. The Data Dependent Acquisition (DDA) mode was utilized for data collection. The detection spanned the mass range of 70–1050 m/z.

# 2.6. Data analysis

The software MassHunter workstation Quantitative Analysis (version v10.0.707.0) preprocessed the raw data obtained from the mass spectrometer detection of the GC/MS. It exported a three-dimensional data matrix in CSV format. This three-dimensional matrix includes the sample details, metabolite names, and mass spectral response intensities. The data matrix underwent dereplication, peak pooling, and elimination of known false positive peaks such as noise, column bleed, and derivatized reagent peaks. The primary public databases used for metabolite identification were NIST (version 2017), Fiehn (version 2013), and MS-DIAL (version 2021).

Principal Component Analysis (PCA) and Orthogonal Partial Least Squares Discriminant Analysis (OPLS-DA) using R package "ropls" (Version 1.6.2). The stability of the model was assessed using a 7-cycle interactive validation. Metabolites with VIP>1 and a p value < 0.05 were considered significantly distinct based on the Variable Importance in Projection (VIP) values derived from the OPLS-DA model and the p values obtained through a Student's t-test.

Metabolic enrichment and pathway analysis were conducted using the KEGG database to map different metabolites between the two groups into their respective biochemical pathways. The metabolites were categorized based on the pathways they were associated with and the tasks they performed. Enrichment analysis utilized the Python package "scipy.stats" to identify the most relevant biological pathways for the experimental treatments.

# 3. Results

#### 3.1. Overview of sample grouping using unsupervised multivariate analysis

Following data processing, 5605 mass spectral peaks were identified in ESI + mode, while 1912 peaks were identified in ESI- mode. Out of these peaks, 781 can be annotated in ESI + mode and 684 in ESI- mode to public databases like HMDB and Lipidmaps. Furthermore, 427 peaks in ESI + mode and 374 peaks in ESI- mode can be identified and matched to the KEGG database.

Principal Component Analysis (PCA) is an unsupervised multivariate statistical analysis technique used to measure the overall differences between sample groups and the variability within groups. The proximity of the spots in the PCA plot indicates a higher degree of similarity in the metabolite expression patterns between the groups of Dendrobium flower EPJ (FPJ) and Dendrobium stem EPJ (SPJ).

Fig. 1A and B demonstrate satisfactory aggregation of quality control (QC) samples in both electrospray ionization positive (ESI+) and negative (ESI-) modes, indicating instrument stability, consistent signals, and experimental reproducibility. The experimental groups SPJ and FPJ demonstrated close clustering in both ESI+ and ESI- PCA plots, with no overlap, suggesting minimal variation within the groups but notable metabolic distinctions between SEP and FEP groups when subjected to the same EPJ preparation and fermentation conditions. This serves as a prerequisite for further analysis of the differential pathways. Nevertheless, the PCA plots of the experimental group revealed a distinct separation between the SPJ and FPJ groups, suggesting that Dendrobium's unique raw material components were instrumental in distinguishing between the two groups.

Partial Least Squares Discriminant Analysis (PLS-DA) is a commonly employed multivariate data analysis method for addressing classification and discriminant issues. By appropriately rotating the principal components, PLS-DA can effectively differentiate between groups of observations. The PLS-DA score plots (Fig. 1C and D) and replacement test plots (Fig. 1E and F) exhibit consistency with the PCA findings, offering clear evidence of a substantial demarcation between the SPJ and FPJ groups, devoid of any overlap. This confirms the outcomes observed in the PCA plots. A Q2 regression line with an intercept lower than 0.05 in the two replacement test plots suggests a robust and reliable model that avoids overfitting.

#### 3.2. KEGG compound classification and pathway statistics

The KEGG database helps conduct metabolic analysis and investigate metabolic networks in living organisms. Cross-referencing it with the KEGG compound database allows us to access the KEGG compound ID numbers for metabolites. These ID numbers offer insights into the biological pathways in which a metabolite is involved and its classification based on biological function [12]. Comparing the identified metabolites with the KEGG compound database yielded metabolite classification profiles, and the associated statistics are depicted in Fig. 2A.

Fig. 2A illustrates that all samples contained a high abundance of amino acids, carboxylic acids, and monosaccharides, with 22, 18, and 12 species, respectively. This finding is consistent with the results. Feng et al.'s [13] study focused on the fermentation of elderberry juice with Lactobacillus bulgaricus and Streptococcus thermophilus. The study demonstrated an increased diversity of amino acids, sugars, flavonols, organic acids, and derivatives during the later stages of fermentation. In addition, Fig. 2A and B provide some information on the pathways linked to the metabolites and emphasize the significance of plant secondary metabolite biosynthesis, phenylpropanoid biosynthesis, p-amino acid metabolism, flavone, and flavonol biosynthesis, and related pathways in the fermentation of Dendrobium species as depicted in EPJ. Therefore, this paper will focus on these metabolites and their related pathways.

#### 3.3. Overview of dendrobium stem EPJ and dendrobium flower EPJ differential compounds

473 differential metabolites were identified in both ESI+ and ESI- modes with statistical significance (P < 0.05 & VIP > 2). Among these, 152 compounds exhibited up-regulation in SEP expression compared to FEP expression, while 321 compounds showed down-regulation in SEP expression compared to FEP expression. Fig. 3A depicts the volcano plot, highlighting the metabolite variations between the two sample groups and identifying the 10 compounds with the lowest *p* values labeled. Table 1 presents 93 compounds that have been up- or down-regulated and are linked to significant pathways outlined in section 3.2. Out of these, 6 compounds exhibited significant up-regulation, while 23 compounds showed significant down-regulation. The 93 compounds were grouped using heat maps (Fig. 3B), classifying them into 10 groups. This approach provided a more comprehensive insight into each compound's expression in the Dendrobium flower EPJ and Dendrobium stem EPJ.

## 3.4. Differential compound changes

Fig. 3C shows the VIP bar graph for the metabolite. The length of each bar represents the contribution of the metabolite to the difference between the two groups, with larger values indicating more significant differences. The color of the bars indicates the significance of the metabolite difference in the two sample groups, specifically the *p* value. A smaller *p* value corresponds to a higher -log10 (*p* value) and a darker color.

#### 3.4.1. Change of phenylpropanoids and polyketides

Most of the phenyl compounds and polyketides that exhibited notable expression changes in this investigation were flavonoids. Furthermore, several compounds were classified under cinnamic acid, cinnamyl alcohol, coumarin and its derivatives, and tannins. Phenylpropanoids and polyketides exhibiting notable changes in expression were consistently found to be down-regulated in Dendrobium stem EPJs in comparison to Dendrobium flower EPJs.

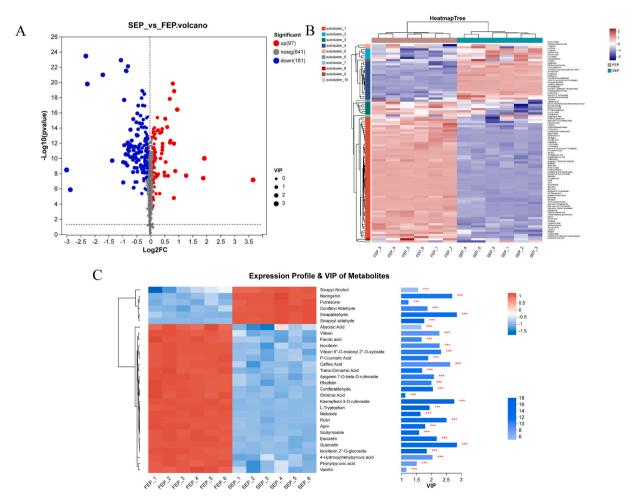


Fig. 3. Differential volcano plots (3A), clustered heat maps (3B) and VIP bar graphs (3C) for SEP vs. FEP.

# Table 1 Differential metabolites in the fermented samples of FEP and SEP.

 $\checkmark$ 

| Metabolite                         | Significant | Regulate | level | KEGG Compound<br>ID | HMDB Superclass                  | HMDB Class                             | HMDB Subclass                               |
|------------------------------------|-------------|----------|-------|---------------------|----------------------------------|--|---|
| Quercetin                          | yes         | down     | B(i)  | C00389              | Phenylpropanoids and polyketides | Flavonoids                             | Flavones                                    |
| Sinapaldehyde                      | yes         | up       | B(ii) | C05610              | Benzenoids                       | Phenols                                | Methoxyphenols                              |
| Kaempferol-3-O-rutinoside          | yes         | down     | B(i)  | C21833              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Varingenin                         | yes         | up       | B(i)  | C00509              | Phenylpropanoids and polyketides | Flavonoids                             | Flavans                                     |
| Caffeic Acid                       | yes         | down     | B(i)  | C01197              | Phenylpropanoids and polyketides | Cinnamic acids and derivatives         | Hydroxycinnamic acids and derivatives       |
| Rutin                              | yes         | down     | B(ii) | C05625              | Phenylpropanoids and polyketides | Flavonoids                             | O-methylated flavonoids                     |
| /itexin 6″-O-malonyl 2″-O-xyloside | yes         | down     | B(ii) | C01460              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| sovitexin                          | yes         | down     | B(i)  | C01714              | Lipids and lipid-like molecules  | Fatty Acyls                            | Fatty amides                                |
| Vitexin                            | yes         | down     | B(i)  | C01460              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Esculetin                          | yes         | down     | B(i)  | C09263              | Phenylpropanoids and polyketides | Coumarins and derivatives              | Hydroxycoumarins                            |
| Apigenin 7-O-beta-D-rutinoside     | yes         | down     | B(ii) | C12627              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Coniferaldehyde                    | yes         | down     | B(ii) | C02666              | Benzenoids                       | Phenols                                | Methoxyphenols                              |
| •                                  |             | down     |       | C02000<br>C01179    | Benzenoids                       | Benzene and substituted                | • •   |
| 4-Hydroxyphenylpyruvic acid        | yes         |          | B(ii) |                     |                                  | derivatives                            | Phenylpyruvic acid derivatives              |
| Rhoifolin                          | yes         | down     | B(ii) | C12627              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| L-Tryptophan                       | yes         | down     | B(ii) | C00078              | Organoheterocyclic compounds     | Indoles and derivatives                | Indolyl carboxylic acids and<br>derivatives |
| P-Coumaric Acid                    | yes         | down     | B(i)  | C02646              | Phenylpropanoids and polyketides | Cinnamyl alcohols                      | Not Available                               |
| Coniferyl Aldehyde                 | yes         | up       | B(i)  | C02666              | Benzenoids                       | Phenols                                | Methoxyphenols                              |
| sovitexin 2″-O-glucoside           | yes         | down     | B(ii) | C04199              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Apiin                              | yes         | down     | B(ii) | C04858              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Sinapoyl aldehyde                  | ves         | up       | B(i)  | C05610              | _                                | _                                      | _   |
| Frans-Cinnamic Acid                | yes         | down     | B(i)  | C00423              | Phenylpropanoids and polyketides | Cinnamic acids and derivatives         | Cinnamic acids                              |
| Ferulic acid                       | yes         | down     | B(ii) | C01494              | Phenylpropanoids and polyketides | Cinnamic acids and derivatives         | Hydroxycinnamic acids and<br>derivatives    |
| Abscisic Acid                      | yes         | down     | B(i)  | C06082              | Lipids and lipid-like molecules  | Prenol lipids                          | Sesquiterpenoids                            |
| Vieloside                          | yes         | down     | B(ii) | C04199              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Scolymoside                        | yes         | down     | B(ii) | C12630              | Phenylpropanoids and polyketides | Tannins                                | Hydrolyzable tannins                        |
| Sinapyl Alcohol                    | yes         | up       | B(i)  | C02325              | Benzenoids                       | Phenols                                | Methoxyphenols                              |
| Phenylpyruvic acid                 | yes         | down     | B(ii) | C00166              | Benzenoids                       | Benzene and substituted<br>derivatives | Phenylpyruvic acid derivatives              |
| Putrescine                         | yes         | up       | B(i)  | C00134              | Organic nitrogen compounds       | Organonitrogen compounds               | Amines                                      |
| Vanillin                           | yes         | down     | B(ii) | C00755              | Benzenoids                       | Phenols                                | Methoxyphenols                              |
| Shikimic Acid                      | ves         | down     | B(i)  | C00493              | Organic oxygen compounds         | Organooxygen compounds                 | Alcohols and polyols                        |
| -Glutamic Acid                     | no          | up       | B(i)  | C00495<br>C00025    | Organic acids and derivatives    | Carboxylic acids and derivatives       | Amino acids, peptides, and<br>analogues     |
| N-Acetyl-D-phenylalanine           | no          | up       | B(i)  | C05620              | _                                | _                                      | -   |
| Marmesin                           | no          | down     | B(ii) | C09276              | Phenylpropanoids and polyketides | Coumarins and derivatives              | Furanocoumarins                             |
| Kaempferol 3-O-Sophoroside         | no          | down     | B(i)  | C12634              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| ampranthin II                      | no          | down     | B(ii) | C12634              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| 3,4-Flavandione                    | no          | down     | B(ii) | C01495              | Phenylpropanoids and polyketides | Flavonoids                             | Flavones                                    |
| Malic acid                         | no          | down     | B(i)  | C00149              | Organic acids and derivatives    | Hydroxy acids and derivatives          | Beta hydroxy acids and derivat              |
| Kaempferol-3-O-Glucoside           | no          | down     | B(i)  | C12249              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| Quercetin 3-beta-D-glucoside       | no          | down     | B(i)  | C05623              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |
| -Glutamine                         | no          | down     | B(ii) | C00064              | Organic acids and derivatives    | Carboxylic acids and derivatives       | Amino acids, peptides, and<br>analogues     |
| Astragalin                         | no          | down     | B(i)  | C12249              | Phenylpropanoids and polyketides | Flavonoids                             | Flavonoid glycosides                        |

# Table 1 (continued)

| Metabolite                            | Significant | Regulate | level | KEGG Compound<br>ID | HMDB Superclass                         | HMDB Class                          | HMDB Subclass                            |
|---------------------------------------|-------------|----------|-------|---------------------|---|-------------------------------------|--|
| 5-Hydroxyferulic acid                 | no          | down     | B(ii) | C05619              | Phenylpropanoids and polyketides        | Cinnamic acids and derivatives      | Hydroxycinnamic acids and<br>derivatives |
| Kaempferol                            | no          | down     | B(i)  | C05903              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavones                                 |
| 2-Pyrocatechuic Acid                  | no          | down     | B(i)  | C00196              | Benzenoids                              | Benzene and substituted derivatives | Benzoic acids and derivatives            |
| 5'-Methylthioadenosine                | no          | down     | B(ii) | C00170              | Nucleosides, nucleotides, and analogues | 5"-deoxyribonucleosides             | 5"-deoxy-5"-thionucleosides              |
| Quercetin 3-O-rhamnoside              | no          | down     | B(ii) | C01750              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavonoid glycosides                     |
| Aspartic Acid                         | no          | down     | B(i)  | C00049              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| 1-Pyrroline-4-hydroxy-2-carboxylate   | no          | up       | B(ii) | C04282              | Organoheterocyclic compounds            | Pyrrolines                          | Not Available                            |
| 1-Aminocyclopropanecarboxylic Acid    | no          | up       | B(i)  | C01234              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| Quercetin 3-O-glucoside               | no          | down     | B(i)  | C05623              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavonoid glycosides                     |
| Octadec-9-enoic Acid                  | no          | down     | B(ii) | C00712              | Lipids and lipid-like molecules         | Fatty Acyls                         | Fatty acids and conjugates               |
| Isoquercitrin                         | no          | down     | B(i)  | C05623              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavonoid glycosides                     |
| Protocatechuic Acid                   | no          | down     | B(i)  | C00230              | Benzenoids                              | Benzene and substituted derivatives | Benzoic acids and derivatives            |
| L-Aspartic Acid                       | no          | down     | B(i)  | C00049              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| Quercetin 3,7-Dimethyl Ether          | no          | down     | B(i)  | C01265              | Phenylpropanoids and polyketides        | Flavonoids                          | O-methylated flavonoids                  |
| I-Histidine                           | no          | down     | B(i)  | C00135              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| L-Glutamate                           | no          | down     | B(i)  | C00025              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| Salicylic Acid                        | no          | up       | B(i)  | C00805              | Benzenoids                              | Benzene and substituted derivatives | Benzoic acids and derivatives            |
| Acacetin 7-[apiosyl (1->6)-glucoside] | no          | up       | B(ii) | C01470              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavonoid glycosides                     |
| 4-Hydroxybenzoic Acid                 | no          | up       | B(i)  | C00156              | Benzenoids                              | Benzene and substituted derivatives | Benzoic acids and derivatives            |
| 2,5-Dioxopentanoate                   | no          | up       | B(ii) | C00433              | Organic acids and derivatives           | Keto acids and derivatives          | Short-chain keto acids and derivatives   |
| Oxoglutaric acid                      | no          | down     | B(i)  | C00026              | Organic acids and derivatives           | Keto acids and derivatives          | Gamma-keto acids and derivatives         |
| L-Alanine                             | no          | up       | B(i)  | C00041              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and<br>analogues  |
| Palmitic acid                         | no          | up       | B(ii) | C00249              | Lipids and lipid-like molecules         | Fatty Acyls                         | Fatty acids and conjugates               |
| Isowertin 2"-rhamnoside               | no          | up       | B(ii) | C12629              | Phenylpropanoids and polyketides        | Flavonoids                          | Flavonoid glycosides                     |
| Octanoate                             | no          | up       | B(ii) | C06423              | Lipids and lipid-like molecules         | Fatty Acyls                         | Fatty acids and conjugates               |
| Caprylic acid                         | no          | down     | B(ii) | C06423              | Lipids and lipid-like molecules         | Fatty Acyls                         | Fatty acids and conjugates               |
| Xanthine                              | no          | down     | B(i)  | C00385              | Organoheterocyclic compounds            | Imidazopyrimidines                  | Purines and purine derivatives           |
| L-Lysine                              | no          | down     | B(ii) | C00047              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| Allysine                              | no          | down     | B(ii) | C04076              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues     |
| 5'-Guanylic Acid                      | no          | down     | B(i)  | C00144              | Nucleosides, nucleotides, and analogues | Purine nucleotides                  | Purine ribonucleotides                   |
| l-Asparagine                          | no          | down     | B(i)  | C00152              | Organic acids and derivatives           | Carboxylic acids and derivatives    | Amino acids, peptides, and               |

(continued on next page)

8

# Table 1 (continued)

9

| Metabolite                                   | Significant | Regulate     | level | KEGG Compound<br>ID | HMDB Superclass                  | HMDB Class                          | HMDB Subclass                        |
|--|-------------|--------------|-------|---------------------|----------------------------------|-------------------------------------|--------------------------------------|
| D-Ornithine                                  | no          | up           | B(i)  | C00515              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Threonine                                  | no          | down         | B(i)  | C00188              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Serine                                     | no          | down         | B(i)  | C00065              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Phenylalanine                              | no          | down         | B(i)  | C00079              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Glycine                                    | no          | up           | B(i)  | C00037              | _                                | _                                   | -                                    |
| L-Methionine                                 | no          | down         | B(ii) | C00073              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Valine                                     | no          | up           | B(i)  | C00183              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| L-Proline                                    | no          | up           | B(i)  | C00148              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| 2,3,4,5-Tetrahydro-2-pyridinecarboxylic acid | no          | down         | B(ii) | C00450              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| Succinic Acid                                | no          | up           | B(i)  | C00042              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Dicarboxylic acids and derivatives   |
| P-Coumaraldehyde                             | no          | down         | B(ii) | C05608              | Phenylpropanoids and polyketides | Cinnamaldehydes                     | Not Available                        |
| Tyramine                                     | no          | down         | B(i)  | C00483              | Benzenoids                       | Benzene and substituted derivatives | Phenethylamines                      |
| Pipecolic Acid                               | no          | down         | B(i)  | C00408              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| 4-Hydroxy-3-methoxycinnamaldehyde            | no          | down         | B(i)  | C02666              | Benzenoids                       | Phenols                             | Methoxyphenols                       |
| Linoleic Acid                                | no          | up           | B(i)  | C01595              | Lipids and lipid-like molecules  | Fatty Acyls                         | Lineolic acids and derivatives       |
| Salicylaldehyde                              | no          | down         | B(i)  | C06202              | Organic oxygen compounds         | Organooxygen compounds              | Carbonyl compounds                   |
| L-Tyrosine                                   | no          | up           | B(i)  | C00082              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| Alanylalanine                                | no          | up           | B(i)  | C00993              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| 5-Aminopentanoic acid                        | no          | up           | B(ii) | C00431              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| 5-Aminovaleric Acid                          | no          | down         | B(i)  | C00431              | Organic acids and derivatives    | Carboxylic acids and derivatives    | Amino acids, peptides, and analogues |
| 4-Hydroxybenzaldehyde                        | no          | no<br>change | B(i)  | C00633              | Organic oxygen compounds         | Organooxygen compounds              | Carbonyl compounds                   |

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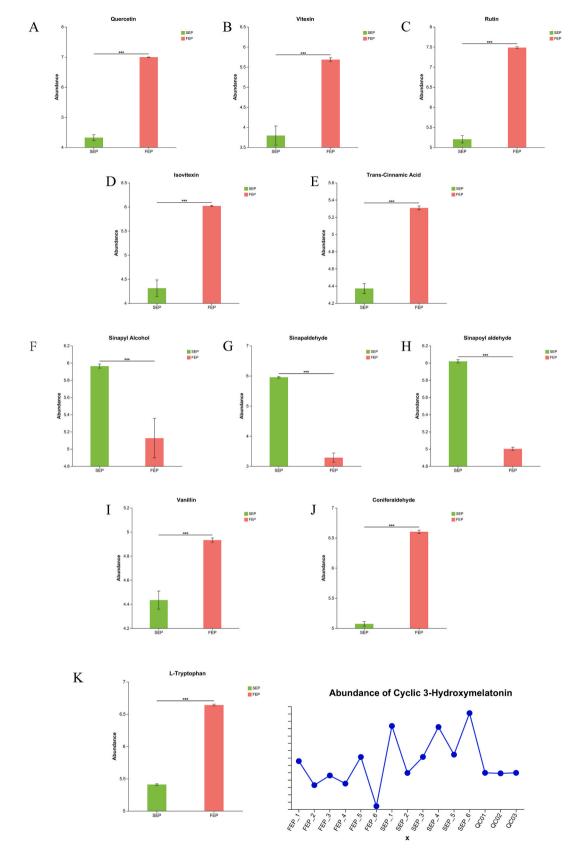


Fig. 4. Differential compound changes of Phenylpropanoids and polyketides (4A~4E), Phenolic compounds (4F~4J) and amino acids (4K).

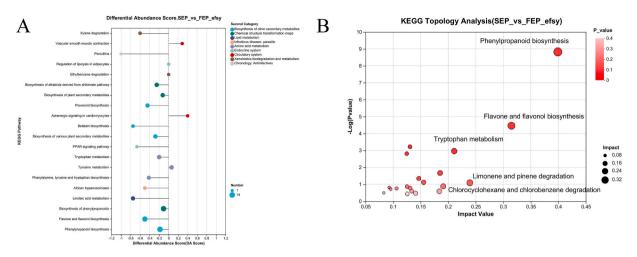


Fig. 5. KEGG pathway differential abundance score plot (5A) versus KEGG topology analysis bubble plot (5B).

The metabolism of flavonoids constitutes a significant aspect of phenylpropanoid metabolism. While not categorized as a flavonoid, mangiferic acid is a precursor for producing phenylalanine, an indispensable raw material in phenylpropanoid metabolism. Phenylalanine is a final product of the mangiferic acid pathway [14]. *Trans*-cinnamic acid, generated through the catalysis of phenylalanine, functions as the initial crucial compound, guiding the metabolic pathway from the mangiferous acid pathway toward different branches of phenylalanine metabolism [15]. Flavonoids, including naringenin, quercetin, vitexin, rutin, and their derivatives, are considered intermediate or end products within the flavonoid pathways [15]. The decreased expression of these compounds in Dendrobium stem EPJs, compared to Dendrobium flower EPJs, indicates that phenylpropanoid metabolism in Dendrobium flower EPJs is more vigorous and mainly focused on flavonoid synthesis. This observation could be attributed to the heightened sensitivity of Dendrobium flowers to relatively unfavorable fermentation conditions. In reaction, Dendrobium flowers up-regulate the expression of flavonoid structural genes to synthesize flavonoids, thereby enhancing their resistance to external oxidative damage and biological infection [16,17]. The results align with the findings presented in the VIP bar graph.

Flavonoids, functioning as antioxidants, alleviate oxidative harm resulting from the buildup of reactive oxygen species (ROS) triggered by abiotic stresses such as soil salinity, drought, and temperature fluctuations. The transamination of phenylalanine by transaminases resulted in a notable up-regulation of phenyl pyruvic acid in the EPJ of Dendrobium flowers. Moreover, phenyl pyruvic acid undergoes additional reduction to form 3-phenylacetic acid (PLA) through dehydrogenase. Polylactic acid (PLA) has been identified as an antimicrobial compound with wide-ranging activity [18], indicating a potential antimicrobial role for Dendrobium flower EPJ that merits additional investigation.

The bar graphs depicting the abundance of significant phenylpropanoids and polyketides in Dendrobium flower EPJ and Dendrobium stem EPJ are presented in Fig.  $4A. \sim 4E$ .

#### 3.4.2. Change of phenolic compounds

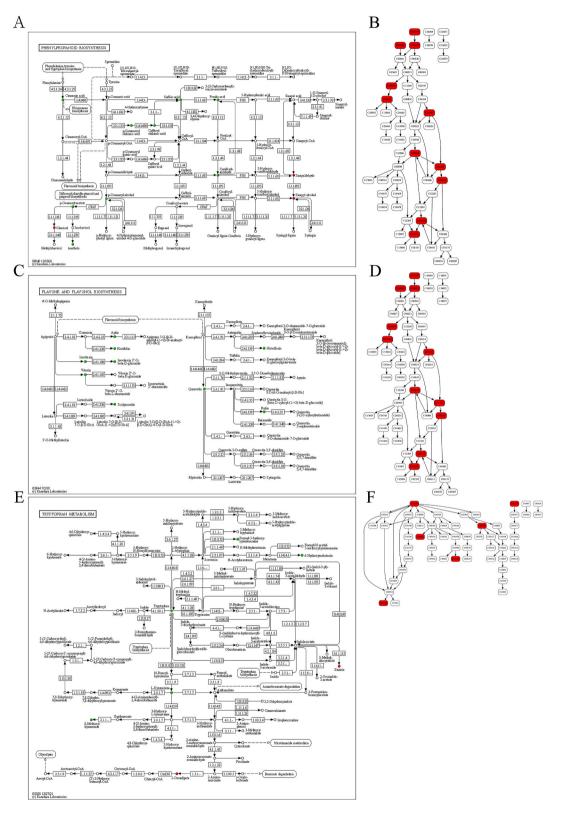
The presence of phenolic compounds in EPJ products may be attributed to the release of polyphenolic compounds that result from the degradation of Dendrobium plant components during LAB fermentation [19]. These compounds may also be synthesized as a defense mechanism by Dendrobium plant cells in reaction to the adverse conditions resulting from bacterial fermentation [20].

Table 1 illustrates the presence of five phenolic compounds that exhibited notable regulation, with three demonstrating significant up-regulation and two showing significant down-regulation. It is important to note that pinus aldehyde, sinapaldehyde, sinapoyl aldehyde, sinapyl alcohol, and vanillin are all products of lignin hydrolysis [21]. Nevertheless, no measurable lignin was detected in either set of samples. This indicates that microorganisms completely hydrolyzed the lignin in Dendrobium flowers and stems into various lignin monomers during the later stages of fermentation. In Dendrobium stems, the degradation of lignin primarily resulted in the formation of cinnamaldehyde and its derivatives.

In contrast, in Dendrobium flowers, lignin degradation led to the production of two different lignin monomers, pinus aldehyde and vanillin. These low molecular weight phenolic compounds exhibit antioxidant, anti-free radical, anti-inflammatory, and anti-cancer properties. The bar graphs depicting the abundance of major phenolic compounds in Dendrobium flower EPJ and Dendrobium stem EPJ are presented in Fig. 4F~4G.

#### 3.4.3. Change of amino acids

The metabolism of various amino acids exhibited less variation between SEP and FEP despite the significance of this pathway. Significant down-regulation was observed only in L-tryptophan. The observed phenomenon may be attributed to the high metabolic activity of phenylpropanoids and polyketides in the exudates of the epidermal papillae of Dendrobium flowers. In addition to its role in amino acid metabolism, L-tryptophan is also implicated in several secondary metabolic pathways, such as isoflavonoid biosynthesis,



**Fig. 6.** Relative positions and adjustment trends of important compounds in the pathway maps of Phenylpropanoids biosynthesis (6A/6B), Flavone and flavonol biosynthesis (6C/6D) and Tryptophan metabolism (6E/6F).

flavonoid biosynthesis, and phenylpropanoid biosynthesis. L-tryptophan acts as a precursor for bioactive compounds such as melatonin (MEL), serotonin (5-HT), and 3-indoleacetic acid (3-IAA) [22]. This suggests that the up-regulated level of L-tryptophan in the Dendrobium flower FEP has the potential to promote sleep by facilitating the synthesis of melatonin in the fermentation or human environment.

Nevertheless, upon analyzing L-tryptophan metabolism, it was observed that the melatonin byproduct, cyclic 3-hydroxy melatonin, exhibited an up-regulation in Dendrobium stem EPJ compared to Dendrobium flower EPJ. The phytomelatonin pathway is crucial in removing excessive reactive oxygen species (ROS) and collaborates with other mechanisms to mitigate diverse abiotic stresses. Cyclic 3-hydroxymelatonin, a metabolite derived from phytomelatonin, is produced due to reactive oxygen species (ROS) scavenging [23]. Cyclic 3-hydroxy melatonin has demonstrated superior antioxidant efficacy to melatonin or vitamin C, as it can scavenge hydroxyl radicals (HO). Moreover, to restore oxidized horseradish peroxidase to its initial state [24]. Therefore, this indicates a potential antioxidant capacity for Dendrobium stem EPJ.

The abundance plots of L-tryptophan and Cyclic 3-hydroxy melatonin in the EPJ of Dendrobium flowers and stems are depicted in Fig. 4K.

# 3.5. KEGG pathway enrichment analysis

The KEGG pathway enrichment analysis was utilized to ascertain the biological pathways and roles linked to the identified differential compounds. Fig. 5B displays a bubble plot depicting the outcomes of the KEGG enrichment analysis. The x-axis denotes the significance of the enrichment p value, where lower values correspond to higher statistical significance. A p value below 0.05 is commonly regarded as indicative of a significantly enriched term. The y-axis is indicative of the KEGG pathway. The size of the bubbles in the graph reflects the degree of enrichment of the pathway with the differential compounds. The three most prominent pathways identified were phenylpropanoid biosynthesis, flavone and flavonol biosynthesis, and tryptophan metabolism.

In Fig. 5A, the x-axis denotes the Differential Abundance Score (DA Score), whereas the y-axis represents the names of the KEGG pathways. The Differential Abundance (DA) score represents the cumulative alterations in all metabolites along the pathway, while the length of the line segments signifies the magnitude of the DA score. The size of the dots reflects the quantity of annotated differential metabolites within the pathway, where larger dots correspond to a higher number of differential metabolites. The dots are positioned to the right of the central axis. As the length of the line segment increases, the overall expression of the pathway is up-regulated in the Dendrobium stem EPJ in comparison to the Dendrobium flower EPJ.

Conversely, the dots are distributed to the left of the central axis, and the longer the line segment, the more downregulated the overall expression of the pathway in Dendrobium Stem EPJ compared to Dendrobium Flower EPJ. Fig. 5A depicts the 20 pathways with the lowest *p* values, indicating that several crucial pathways are downregulated in Dendrobium stem EPJ. These pathways include phenylpropanoid biosynthesis, flavone and flavonol biosynthesis, and tryptophan metabolism.

#### 3.5.1. The KEGG topology analyzed pathway maps of the phenylpropanoids biosynthesis

Both Fig. 6A and B depict the KEGG pathway of phenylpropanoid biosynthesis. In Fig. 6B, metabolites depicted on a white background denote metabolites within this pathway, whereas metabolites shown on a red background indicate differentially regulated compounds. In Fig. 6A, the compounds highlighted in green represent down-regulated compounds in the Dendrobium stem EPJ in comparison to the Dendrobium flower EPJ. Conversely, the compounds highlighted in red indicate up-regulated compounds in the Dendrobium stem EPJ compared to the Dendrobium flower EPJ. Significantly, the compounds that exhibited up-regulation were primarily concentrated in the middle and upper segments of the phenylpropanoid biosynthetic pathway. In contrast, those showing down-regulation were predominantly concentrated in the lower segments. This observation provides additional evidence for the presence of a heightened phenylpropanoid metabolism in the epidermal papillae (EPJ) of Dendrobium flowers, along with a more prominent breakdown of lignin, specifically sinapyl alcohol, in the EPJ of Dendrobium stems.

#### 3.5.2. The KEGG topology analyzed pathway maps of the flavone and flavonol biosynthesis

Both Fig. 6C and D depict the KEGG pathway of flavone and flavonol biosynthesis. Metabolites with a white background indicate their presence in this pathway, while metabolites labeled in red signify significant up- or down-regulation.

The down-regulation of all significantly adjusted flavones and flavonols was observed, impacting multiple synthesis pathways of these compounds. This finding supports previous analyses indicating the abundance of flavonoid metabolism in Dendrobium flower EPJs. This metabolic activity serves to protect against external oxidative damage and biological infections.

#### 3.5.3. The KEGG topology analyzed pathway maps of the tryptophan metabolism

Both Fig. 6E and F depict the KEGG pathway of Tryptophan metabolism. In Fig. 6F, metabolites in the white background denote metabolites within this pathway; pathways in the red background indicate differentially regulated compounds. Compounds labeled in green in Fig. 6E signify down-regulated compounds at Dendrobium stem EPJ compared to Dendrobium flower EPJ. In contrast, compounds labeled in red represent up-regulated compounds at Dendrobium stem EPJ relative to Dendrobium flower EPJ. The results obtained align with Section 3.4.3.

#### 4. discussion

Untargeted metabolomics analyses using LC-MS were conducted in this study to assess the metabolites present in Dendrobium stem

EPJ and Dendrobium flower EPJ fermented with *Saccharomyces cerevisiae*, Lactobacillus bulgaricus, and Streptococcus thermophilus after the fermentation process. The study analyzed the differential pathways and compounds associated with metabolism in Dendrobium stem EPJ and Dendrobium flower EPJ. A total of 476 distinct compounds were identified.

The study further confirmed that the metabolic pathways involved in phenylpropanoid biosynthesis, flavonoid, and flavonol biosynthesis, and tryptophan metabolism play a crucial role in distinguishing the metabolic profiles of Dendrobium stems EPJs from those of Dendrobium flowers EPJs, as indicated by KEGG pathway enrichment analyses. Additionally, the study examined the positions and effects of the differential compounds within these three metabolic pathways using pathway maps. 93 differential compounds were identified in the three selected pathways, which exhibited the most significant differences between Dendrobium flower EPJ and Dendrobium stem EPJ. The pathways and compounds related to phenylpropanoid biosynthesis, particularly the lignin and flavonoid, were identified as the most significant differential pathways and compounds in distinguishing between Dendrobium stem EPJ and Dendrobium flower EPJ [25].

In the stem of Dendrobium EPJ, the major up-regulated metabolites associated with phenylpropanoid biosynthesis were lignin and its derivatives, including cinnamaldehyde, sinapoyl aldehyde, and sinapyl alcohol. Nevertheless, the precursor compounds in the lignin pathway exhibited down-regulation, indicating potential lignin degradation by lactic acid bacteria (LAB) during the fermentation process. The low molecular weight phenolic compounds exhibit antioxidant, anti-free radical, anti-inflammatory, and anti-cancer properties [26].

Conversely, there was a significant up-regulation of mangiferic acid in the Dendrobium flower EPJ compared to the Dendrobium stem EPJ. The metabolism of phenylalanine and related metabolites in the flavonoid pathway exhibited significant up-regulation in Dendrobium flower EPJ, thereby making the most substantial contribution to the observed differences between the two products. The observed up-regulation could be attributed to the over-expression of flavonoid structural genes in Dendrobium flowers, leading to heightened resistance against external oxidative damage and biological infections. Recent research indicates that flavonoids exhibit anti-inflammatory, vasodilatory, anticoagulant, cardioprotective, antidiabetic, chemoprotective, neuroprotective, anti-obesity, and anti-aging properties, and appropriate anti-aging active activities [27,28]. This statement offers a theoretical foundation and potential for advancing Dendrobium EPJ nutraceuticals.

The tryptophan pathway also plays a crucial role, as L-tryptophan is involved in amino acid metabolism and secondary metabolism, such as isoflavone biosynthesis and flavonoid biosynthesis. It is a precursor to bioactive compounds like melatonin, 5-hydroxytryptophan, and 3-indoleacetic acid [29], suggesting the potential of L-tryptophan in promoting sleep and synthesizing melatonin. In contrast, the cyclic 3-hydroxy melatonin, a metabolite generated through the metabolism of L-tryptophan, exhibited up-regulation in the Dendrobium stem EPJ compared to the Dendrobium flower EPJ. This metabolite exhibits potent antioxidant properties, surpassing melatonin and vitamin C in its ability to scavenge hydroxyl radicals and restore oxidative enzymes [24]. Therefore, the EPJs extracted from the stems and leaves of Dendrobium plants have the potential to exhibit antioxidant capacity by up-regulating cyclic 3-hydroxy melatonin.

This untargeted metabolomics study offers new insights into the distinctions between Dendrobium flowers and stems for EPJ production, which is induced by variations in the plant's raw material source. The substantial modifications in metabolic pathways and compounds contribute to the advancement of scientific knowledge and indicate potential mechanisms for the distinct bioactivities of the two EPJ products. The abundant flavonoid metabolism in flower EPJ implies potential antioxidant, anti-inflammatory, and antimicrobial properties that warrant further investigation. The elevated levels of lignin metabolites in stem EPJ, including cinna-maldehyde and its derivatives, warrant further exploration of their potential antioxidant properties. The Flower EPJ may possess supplementary antimicrobial properties due to containing phenylpyruvic acid and flavonoids. These unique metabolite compositions allow the customizing of functional food products to address particular health advantages. Incorporating Flower EPJ into nutraceuticals or functional foods may enhance antioxidant defense, immune function, or antimicrobial effects. The potential applications of Stem EPJ may be found in products aimed at reducing oxidative stress or promoting cardiovascular health. Future research endeavors may involve the isolation, identification, and quantification of essential bioactive compounds present in the two EPJ products.

## 5. Conclusion

This untargeted metabolomics study revealed significant differences in the metabolic profiles of edible plant Jiaosu (EPJ) products derived from Dendrobium flowers versus stems during fermentation. The flower EPJ exhibited upregulated flavonoid biosynthesis conferring potential antioxidant and antimicrobial properties, while the stem EPJ contained increased levels of lignin metabolites and cyclic 3-hydroxymelatonin with antioxidant capacities. These distinct metabolite compositions indicate opportunities for developing tailored functional EPJ products targeting specific health benefits from the different Dendrobium sources. Further research isolating and quantifying the key bioactive compounds is warranted.

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## Ethical guidelines

Ethics approval was not required for this research.

#### Data availability statement

The data supporting this study's findings are available from the corresponding author upon reasonable request.

#### **CRediT** authorship contribution statement

Lihong Jiang: Writing – original draft, Validation, Methodology, Investigation, Formal analysis, Data curation, Conceptualization. Xingjiang Li: Writing – review & editing, Supervision, Resources, Project administration, Funding acquisition. Shuo Wang: Writing – review & editing, Supervision, Resources, Project administration, Funding acquisition. Du Pan: Writing – review & editing, Methodology, Data curation. Xuefeng Wu: Writing – review & editing, Supervision, Resources, Project administration, Funding acquisition. Fengxu Guo: Writing – review & editing, Methodology, Data curation. Dongdong Mu: Writing – review & editing, Resources, Funding acquisition. Fuhuai Jia: Writing – review & editing, Resources. Min Zhang: Writing – original draft, Validation, Supervision, Resources, Project administration, Investigation, Funding acquisition, Formal analysis, Conceptualization.

#### Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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