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Article

# Effects of Foliar Spraying Organic Selenium and Nano-Selenium Fertilizer on Pak Choi (*Brassica chinensis* var. *pekinensis*. cv. 'Suzhouqing') Under Low Temperature Stress

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**Abstract:** In recent years, frequent occurrences of low temperature disasters due to global climate change have significantly impacted the normal growth of crops. Research has indicated that inorganic selenium (which is more toxic) can not only enhance the effects of low temperature stress but also increase selenium content on plants; however, there is a scarcity of studies investigating the impacts of organic selenium and nano-selenium on crops. In order to investigate whether organic selenium and nano-selenium can enhance low-temperature tolerance and increase selenium content in pak choi (*Brassica chinensis* var. *pekinensis*. cv. 'Suzhouqing'), different concentrations (0, 5, 10, 20 mg L<sup>-1</sup>) of exogenous selenium were applied in this experiment to assess their effects on plant growth, nutritional quality and antioxidant properties. RNA-Seq technology was used to sequence the transcriptome of the leaves. Based on the transcriptome data, a Weighted Gene Co-expression Network Analysis (WGCNA) was employed to construct a network that associates with physiological traits related to stress resistance. Two highly correlated gene co-expression modules were identified, and within them, nine hub genes associated with endocytosis, antioxidant stress, absorption, transport, and metabolism of selenium were discovered. The results indicated that the beneficial effects on yield and total selenium content under low temperature were attributed to (1) protection of photosynthetic pigments for enhancing photosynthetic capacity by the up-regulation of LHca2, LHcb1, LHca1, LHcb4 in KEGG pathway: photosynthesis-antenna proteins; (2) activation of antioxidant system for efficient ROS homeostasis such as SOD, POD and CAT by the genes such as Superoxide dismutase, Monodehydroascorbate and (3) selenium absorption by endocytosis, selenium transportation by ABC transporter gene family and selenium metabolism related genes such as Cysteine synthase, Glutaredoxin. These findings provide a foundation for further investigation into the molecular mechanisms underlying the effects of organic selenium and nano-selenium on cyanochloride production at low temperatures.

**Keywords:** low temperature; organic selenium; nano-selenium; transcriptome; weighted gene co-expression network analysis

## 1. Introduction

In recent years, low temperature disasters caused by global climate change have occurred frequently, seriously affecting the normal growth of crops. Low temperature stress causes a large accumulation of reactive oxygen species in plants, and then causes membrane lipid peroxidation, forming a large number of harmful substances malondialdehyde (Yan et al., 2016). A large number of studies have shown that as a micronutrient, selenium, especially as a component of the antioxidant glutathione peroxidase (GSH-Px), exogenous application of appropriate concentration of selenium fertilizer can participate in the removal of lipid hydrogen, hydrogen peroxide and other free radicals, alleviate the peroxidation damage caused by free radicals, and thus mitigate the adverse effects of low temperature on plant growth and development. Huang et al. (2018) studied the physiological

indexes of strawberries under low temperature stress and found that selenium affected the ascorbic acid (ASA) -glutathione (GSH) cycle under low temperature environment to combat low temperature stress. Liu et al. (2021) found that selenium could not only enhance the cold resistance of tea plants, but also improve tea quality by promoting the accumulation of tea polyphenols, amino acids and sugars.

Selenium fertilizer mainly includes inorganic selenium, organic selenium and nano-selenium. Inorganic selenium fertilizers, such as sodium selenate or sodium selenite, exhibit low absorption and utilization conversion at low concentrations and high toxicity at high concentrations when applied through foliage or soil. As a nutrient element, the safe dose range of selenium is relatively narrow, and it is difficult to control its effective dosage (Wang et al., 2019). At present, organic selenium and nano-selenium fertilizers are mainly used. Nano-selenium refers to protein-dispersed selenium nanoparticles with particle size less than 60 nm, which have large specific surface area and high catalytic activity, biological function, antioxidant property and absorptivity. Research has indicated that inorganic selenium can not only enhance the effects of low temperature stress but also increase selenium content on plants; however, there is a scarcity of studies investigating the impacts of organic selenium and nano-selenium on crops.

The Suzhouqing variety is pak choi (*Brassica chinensis* var. *pekinensis*), belonging to the ordinary cabbage type. It possesses high nutritional value and ranks among the vegetables with high content of various vitamins and mineral elements. Moreover, it can effectively maintain blood vessel elasticity over an extended period of time. Additionally, this variety is rich in fiber, which aids in alleviating constipation and provides essential nutrients for normal physiological requirements while enhancing the body's innate immunity. In order to investigate whether organic selenium and nano-selenium can enhance low-temperature tolerance and increase selenium content in pak choi (*Brassica chinensis* var. *pekinensis*. cv. 'Suzhouqing'), different concentrations (0, 5, 10, 20 mg L<sup>-1</sup>) of exogenous selenium were applied in this experiment to assess their effects on plant growth, nutritional quality and antioxidant properties.

In recent years, there has been an increasing number of studies utilizing RNA sequencing technology to investigate the effects of selenium on plants. Rao et al. (2020) integrated the sequencing results from PacBio SMRT and Illumina RNA-SEQ platforms, analyzing a total of 948 differential genes, out of which 11 were found to be associated with selenium metabolism in the selenium-accumulating plant *Cardamine violifolia*. They revealed candidate genes and pathways involved in selenium metabolism. Zhou et al. (2018) sequenced the RNA of *Cardamine hupingshanensis* seedlings after applying selenium and identified 25 genes that significantly responded to selenium stress, showing significant enrichment in four pathways. Guo et al. (2020) discovered structural genes, phosphate transporters, and sulfate transporters that may play a role in selenium metabolism when studying *Pueraria lobata* (Willd.) Ohwi's response to molecular-level selenium stimulation. Cao et al. (2018) observed that differential genes in tea trees responding to selenium stimulation were significantly enriched in four pathways.

Therefore, transcriptome sequencing analysis was conducted to identify differentially expressed genes and analyze enriched metabolic pathways associated with these genes. Ultimately, this study aims to reveal both physiological and biochemical mechanisms as well as molecular regulatory mechanisms underlying leaf responses to cold stress when applying selenium on leaf surfaces. These findings will provide a theoretical basis for future production strategies involving Suzhouqing.

## 2. Materials and methods

### 2.1. Plant materials and experimental conditions

The experiment was conducted on November 18, 2022, at the laboratory of Jiangxi Agricultural University in Nanchang, Jiangxi Province. The seeds were sown in a culture dish and allowed to grow for one week. Once the seedlings developed three leaves and a heart-shaped structure, they were transplanted into pot (33×24.4×13.5 cm) containing 320 g of soil for cultivation. Two seedlings were cultivated in each pot, and after 33 days (November 19, 2022) of growth, they were transferred

to an artificial climate chamber for two weeks under low temperature stress conditions. The culture environment in the artificial climate chamber was set as follows: light intensity of 2000 lx with a photoperiod cycle of 12 hours light/12 hours dark, temperature maintained at 2°C, and humidity at 75%. For the experiment, organic selenium and nano-selenium fertilizers were used with varying concentrations: LO5 (organic selenium concentration of 5 mg L<sup>-1</sup>), LO10 (organic selenium concentration of 10 mg L<sup>-1</sup>), LO20 (organic selenium concentration of 20 mg L<sup>-1</sup>), LN5 (nano-selenium concentration of 5 mg L<sup>-1</sup>), LN10 (nano-selenium concentration of 10 mg L<sup>-1</sup>), LN20 (nano-selenium concentration of 20 mg L<sup>-1</sup>), and LCK (water, 5 mg L<sup>-1</sup>). The organic selenium fertilizer and nano-selenium fertilizer were applied three times throughout the entire growth period, specifically on December 9th, 16th, and 27th.

## 2.2. Determination of physiological and biochemical indexes

The chlorophyll a and b content, carotenoid content, superoxide dismutase (SOD) activity, peroxidase (POD) activity, malondialdehyde (MDA) content, reduced glutathione (GSH), soluble protein content and amino acid content were determined following Wang and Huang's study in 2015.

## 2.3. Transcriptome sequencing.

The total RNA was extracted using a plant total RNA extraction kit, and subsequently analyzed for RNA degradation and contamination through agarose-gel electrophoresis. The purity of the RNA was assessed using Nanodrop, while the concentration was accurately quantified with Qubit. Furthermore, the integrity of the RNA was precisely determined using Agilent 2100. Once qualified, the samples were subjected to Illumina sequencing, encompassing all eukaryotic RNAs. High-quality data facilitated splicing by Trinity, resulting in the longest transcript unigene that served as a reference sequence for subsequent analysis involving expression quantification and functional annotation.

# 3. Results

## 3.1. Photosynthetic pigments

After spraying different concentrations of organic selenium and nano-selenium on Suzhouqing leaves, the chlorophyll content of the leaves was measured and recorded in Table 1. Compared to the control group, the treatments with LO5, LO10, and LO20 showed an increase in chlorophyll a content by 16.85%, 6.74%, and 71.91% respectively, with LO20 treatment exhibiting the most significant effect. Similarly, LN5, LN10, and LN20 treatments resulted in an increase in chlorophyll a content by 17.98%, 15.73%, and 11.24% respectively; among these treatments, LN10 had the highest chlorophyll a content observed. The application of LO5 led to a 4.44% increase in chlorophyll b content while LO20 exhibited a significant increase of 40%. Furthermore, carotenoid content increased significantly for all three treatments: LO5 (43.89%), LO10 (31.43%), and especially for LO20 (131%). Notably though there was no significant difference between carotenoid contents at concentrations LN10 and LN20 indicating that effective increases can be achieved even at lower concentrations.

**Table 1.** Photosynthetic pigment content of Suzhouqing treated with different concentrations of organic selenium and nano-selenium.

Treatment	Chlorophyll a content (mg g <sup>-1</sup> fresh weight)	Chlorophyll b content (mg g <sup>-1</sup> fresh weight)	Total chlorophyll content (mg g <sup>-1</sup> fresh weight)	Chlorophyll a/b	Carotenoid content (μg g <sup>-1</sup> )
LCK	0.89±0.02e	0.45±0.02bc	1.34±0.01c	1.96±0.15 c	107.85±4.39d
LO5	1.04±0.05bc	0.47±0.02b	1.5±0.04b	2.23±0.16 ab	155.18±7.11bc
LO10	0.95±0.02de	0.43±0.02c	1.37±0.02c	2.22±0.1b	141.75±13.35c
LO20	1.53±0.03a	0.63±0.02a	2.16±0.03a	2.44±0.1a	249.83±16.58a
LN5	1.05±0.05b	0.47±0.02b	1.52±0.07b	2.24±0.11 ab	165.49±13.51b
LN10	1.03±0.04bc	0.45±0.04bc	1.48±0.06b	2.29±0.2a b	145.46±7.23c
LN20	0.99±0.05cd	0.46±0.01b	1.45±0.05b	2.13±0.09 bc	146.14±18.27bc

Note: Lowercase letters indicate significant difference between treatments (0.05) in this paper.

### 3.2. Antioxidant properties of leaves

As illustrated in Table 2, compared to the control group, Suzhouqing leaves treated with LO5, LO10, and LO20 exhibited a remarkable increase in SOD activity by 73.92%, 38.72%, and 341.16% respectively, with statistically significant differences observed; notably, the highest level was achieved under LO20 treatment conditions. In contrast, SOD activity displayed a trend of initial decline followed by subsequent elevation within LN5, LN10, and LN20 treatment groups. While LN5 treatment resulted in a significant decrease of 39.87% in SOD content compared to the control group, both LN10 and LN20 treatments led to substantial increases of 31.39% and 38.80% respectively; however, these differences were not statistically significant.

The POD activity of Suzhouqing leaves treated with different concentrations of organic selenium is presented in Table 2. In the LO5, LO10, and LO20 treatment groups, there was a significant increase in POD activity by 177.53%, 26.60%, and 100.06% respectively. In conclusion, appropriate concentration of organic selenium spray treatment can activate cellular antioxidant enzyme systems, enhance POD activity, improve stress resistance capabilities, and delay plant senescence. The table below illustrates the POD activity of leaves treated with different concentrations of nano-selenium. In LN5, LN10, and LN20 treatment groups, there was an initial decrease followed by an increase in POD activity trend observed. Compared to the control group, leaves treated with LN5 exhibited a significant decrease in POD content by 20.01%. However, leaves treated with LN10 and LN20 showed a significant increase in POD content by 24% and 31.69% respectively; among them, LN20 reached its maximum value.

As depicted in Table 2, LO20 treatment demonstrated the most significant enhancement of CAT activity, exhibiting an increase of 85.96% compared to the control group. LO5 and LO10 treatments resulted in respective increases of 6.65% and 16.27% in CAT activity, with no significant difference observed for LO5 treatment. These findings indicate that under appropriate concentrations of organic selenium, CAT can effectively inhibit lipid peroxidation and stimulate antioxidant responses. In the LN5, LN10, and LN20 treatment groups, CAT activity exhibited a pattern of initial decrease followed by an increase before decreasing again. Compared to the control group, leaves treated with LN5 showed a notable decrease in CAT content by 30.40%, reaching statistical significance. Conversely, leaves treated with LN10 and LN20 displayed significant increases in CAT content by 69.11% and 27.77%, respectively; among them, LN10 achieved the highest value.

After the application of nano-selenium, the content of reduced glutathione (GSH) increased to 23.82%, 13.28%, and 4.98% respectively (Table 2). In comparison with the control group, the GSH content sprayed with organic selenium was found to be 34.89%, 12.77%, and 9.55% respectively. Reduced glutathione serves as a crucial indicator for characterizing cellular antioxidant capacity, while its oxidation product is known as oxidized glutathione (GSSG). The increase in GSSG content indirectly suggests the presence of oxidative stress.

**Table 2.** Antioxidant properties of green Suzhouqing treated with different concentrations of organic selenium and nano-selenium.

Treatment	LCK	LO5	LO10	LO20	LN5	LN10	LN20
SOD activity (U g <sup>-1</sup> fresh weight)	286.76± 21.55d	498.74± 16.02b	397.78± 14.34c	1265.06± 81.01a	172.44± 14.78e	376.78± 9.21c	398.03± 22.41c
POD activity (U g <sup>-1</sup> fresh weight)	49.63± 3.16d	137.74± 6.40a	62.83± 3.78c	99.29± 4.19b	39.7±2.04e	61.54± 2.09c	65.36± 1.91c
CAT content (μmol min <sup>-1</sup> g <sup>-1</sup> fresh weight)	122.68± 7.78e	130.84± 4.58de	142.64± 4.32d	228.14± 10.99a	85.38± 4.22f	207.46± 11.89b	156.75± 8.74c
GSH content (μmol g <sup>-1</sup> fresh weight)	0.29± 0.01c	0.33± 0.01b	0.28± 0.02c	0.46± 0.01a	0.33± 0.01b	0.35± 0.01b	0.28± 0.01c

### 3.4. Leaf weight and total selenium content

The leaf quality of individual plants is a crucial criterion for assessing the yield of green leaves in leaves. As depicted in Table 3, in this experiment, the LO5, LO10, and LO20 treatments exhibited respective increases of 30.26%, 38.00%, and 0.95%. Similarly, the LN5, LN10, and LN20 treatments demonstrated increases of 16.19%, 28.66%, and 36.89% respectively. The total selenium content is presented in Table 3, showing that spraying organic selenium and nano-selenium led to an increase in total selenium content. Specifically, the LO5, LO10, and LO20 treatments resulted in increases 80.00%, 190.00%, and 140.00% respectively; while the LN5 treatment showed an increase of 90.00%, followed by LN10 with an increase of 220.00% ,and finally LN20 with an increase of 160 .00%.

**Table 3.** Weight and total selenium content of Suzhouqing leaves.

Treatment	LCK	LO5	LO10	LO20	LN5	LN10	LN20
Weight (g fresh weight)	46.27± 0.32c	60.27± 0.27b	65.09± 0.18b	46.71± 0.24c	53.76± 0.73a	59.53± 0.82c	63.34± 0.69b
Total selenium content (mg kg <sup>-1</sup> )	0.001± 0.001b	0.0018± 0.0003a	0.0029± 0.0002b	0.0024± 0.0003c	0.0019± 0.0003b	0.0032± 0.0001b	0.0026± 0.0002a

### 3.4. Nutritional quality of leaves

Soluble amino acids are the fundamental constituents of an organism's protein. As depicted in Table 4, compared to the control group, leaves treated with LO10 exhibited a significant decrease in amino acid content by 11.82%, while those treated with LO5 and LO20 showed significant increases by 19.09% and 32.27% respectively, with LO20 reaching the highest value. In the LN5, LN10, and LN20 treatment groups, soluble sugar displayed an initial increase followed by a subsequent decrease trend. LN5 treatment led to a significant increase in leaf amino acid content by 9.09%, whereas leaves treated with LN10 and LN20 experienced decreases of 7.73% and 4.55% respectively, both reaching significance levels as well. The findings indicate that high concentrations of nano-selenium inhibit amino acid content.

The soluble protein content in plants is often considered as a crucial indicator of plant oxidative senescence. A significant portion of the soluble protein found in mature plant leaves is ribulose diphosphate carboxylase (RuBPCase), which indirectly regulates RuBPCase levels, thereby enhancing photosynthetic capacity during later stages of growth and effectively delaying crop senescence. As shown in Table 4, treatment with LO5, LO10, and LO20 resulted in an increase of 17.51%, 22.46%, and 60.93% respectively in soluble protein content, with LO20 exhibiting the highest value at a statistically significant level. The increased soluble protein content also provided ample nitrogen sources for antioxidant enzyme synthesis, thereby enhancing the plant's ability to scavenge reactive oxygen species and delay leaf senescence while increasing yield potential. In the LN5, LN10, and LN20 treatment groups, there was an initial increase followed by a subsequent decrease observed in soluble protein levels over time. Leaves treated with LN5 showed an increase of 11.06% in soluble protein content while those treated with LN10 exhibited a substantial increase of 49.39%.

Additionally, LN10 treatment demonstrated the highest level of soluble protein content among all treatments with significant differences.

**Table 3.** Nutritional quality of Suzhouqing treated with different concentrations of organic selenium and nano-selenium.

Treatment	Amino acid content (mg g <sup>-1</sup> fresh weight)	Soluble protein (mg g <sup>-1</sup> fresh weight)
LCK	2.2±0.02d	28.49±1.14f
LO5	2.62±0.01b	33.48±0.54cd
LO10	1.94±0.03g	34.89±0.44c
LO20	2.91±0.01a	45.85±0.99a
LN5	2.4±0.03c	31.64±1.07e
LN10	2.03±0.03f	42.56±1.74b
LN20	2.1±0.02e	32.97±1.23de

### 3.5. Leaf gene expression

#### 3.5.1. Sequencing results and quality analysis

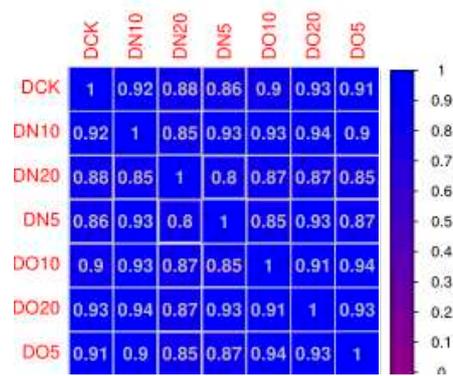
The image data of sequenced fragments were converted into sequence data (reads) using CASAVA base recognition. Transcriptomic libraries were obtained for the control group (LCK), nano-selenium treatment groups (LN5, LN10, and LN20), and organic selenium treatment groups (LO5, LO10, and LO20). Trimmomatic software was utilized to filter the sequencing data, ensuring that over 99% of bases had a Q30 quality score. The sequencing error rate for all samples was less than 0.1%, indicating high quality results (Table 5). These findings demonstrate that RNA-Seq sequencing exhibited excellent quality with randomized and evenly distributed clean reads. By comparing reads that matched unique transcripts, differential genes could be identified.

**Table 5.** Sequencing data statistics.

Treatment	Raw base(G)	Raw sequences	Clean bases(G)	Clean sequences	Q30(%)	GC(%)	Error Rate (%)
LCK	8.13	54217790	7.5	50702038	99.85	47.0(%)	0.03
LO5	7.74	51575524	7.2	48567534	99.86	47.0(%)	0.03
LN5	7.95	52979962	7.39	49869758	99.86	46.0(%)	0.03
LO10	6.47	43115830	5.99	40471030	99.85	47.0(%)	0.03
LN10	6.25	41655152	5.77	38959214	99.85	47.0(%)	0.03
LO20	6.71	44757082	6.25	42197232	99.87	46.0(%)	0.03
LN20	6.06	40381854	5.6	37912748	99.86	47.0(%)	0.03

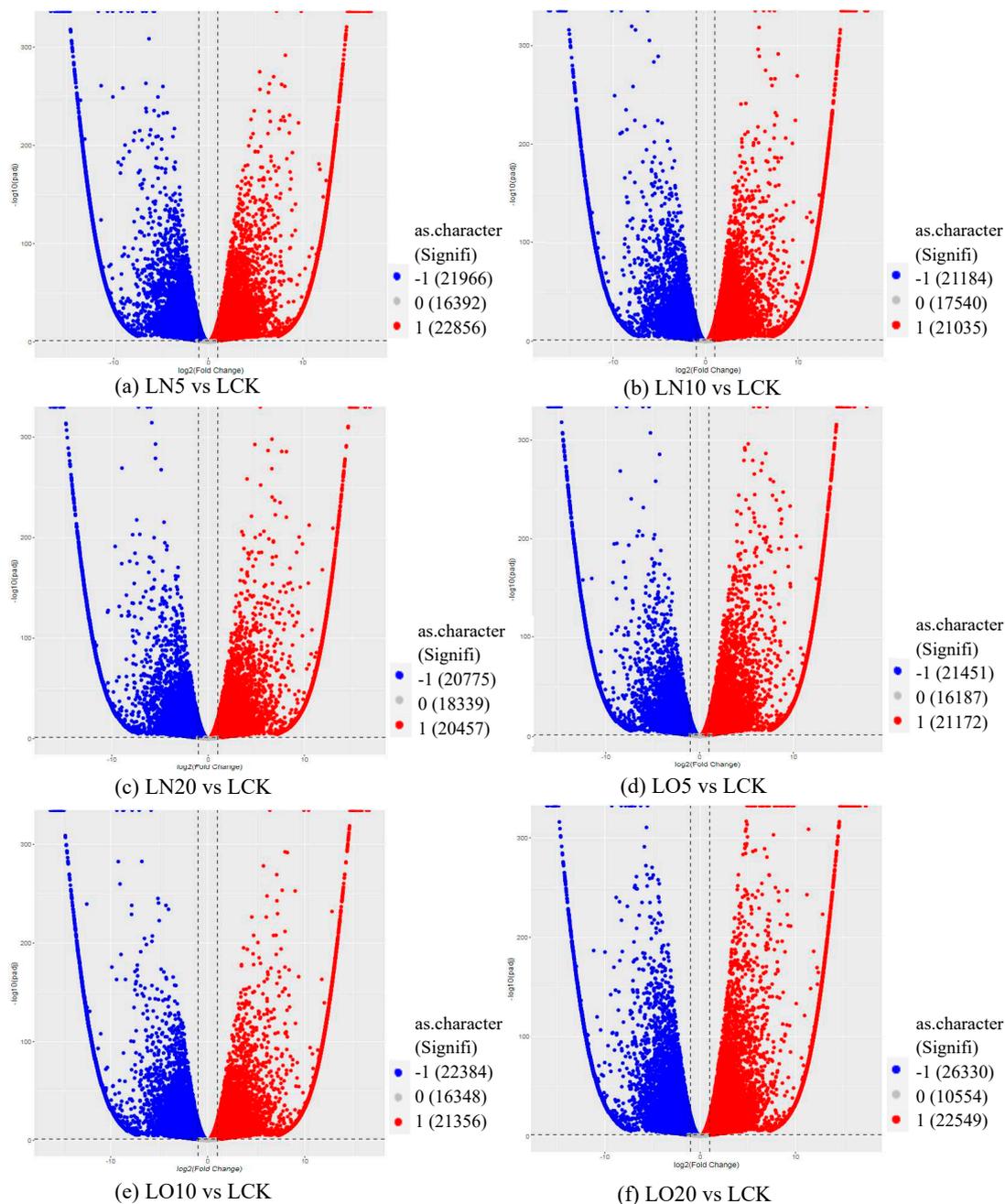
#### 3.5.2. Analysis of differentially expressed genes

Correlation coefficients between groups were computed based on the TPM (Transcripts Per Kilobase Million) values of all genes in the sample. The results revealed that most Pearson correlation coefficients had an R<sup>2</sup> value greater than 0.8, indicating a strong correlation between gene expression levels across samples (Figure 1).



**Figure 1.** Heat map of correlation coefficient between samples.

The volcano plot of differentially expressed genes (Figure 2) provides a visual representation of the overall distribution of these genes. The x-axis represents  $\log_2(\text{FoldChange})$ , which indicates changes in gene expression multiples across different samples, while the y-axis represents  $\log_{10}(\text{padj})$ , which reflects significance levels of expression differences.

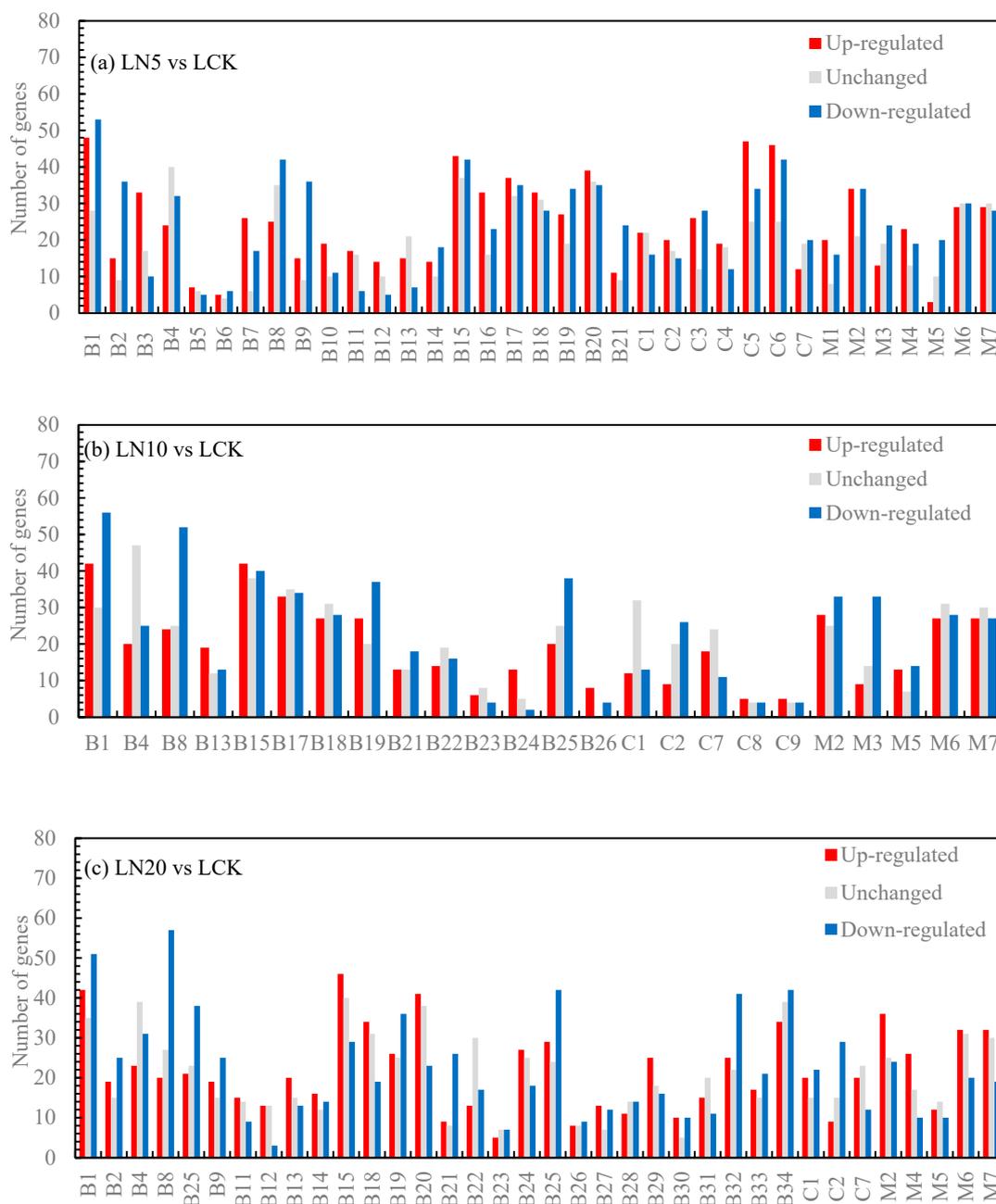


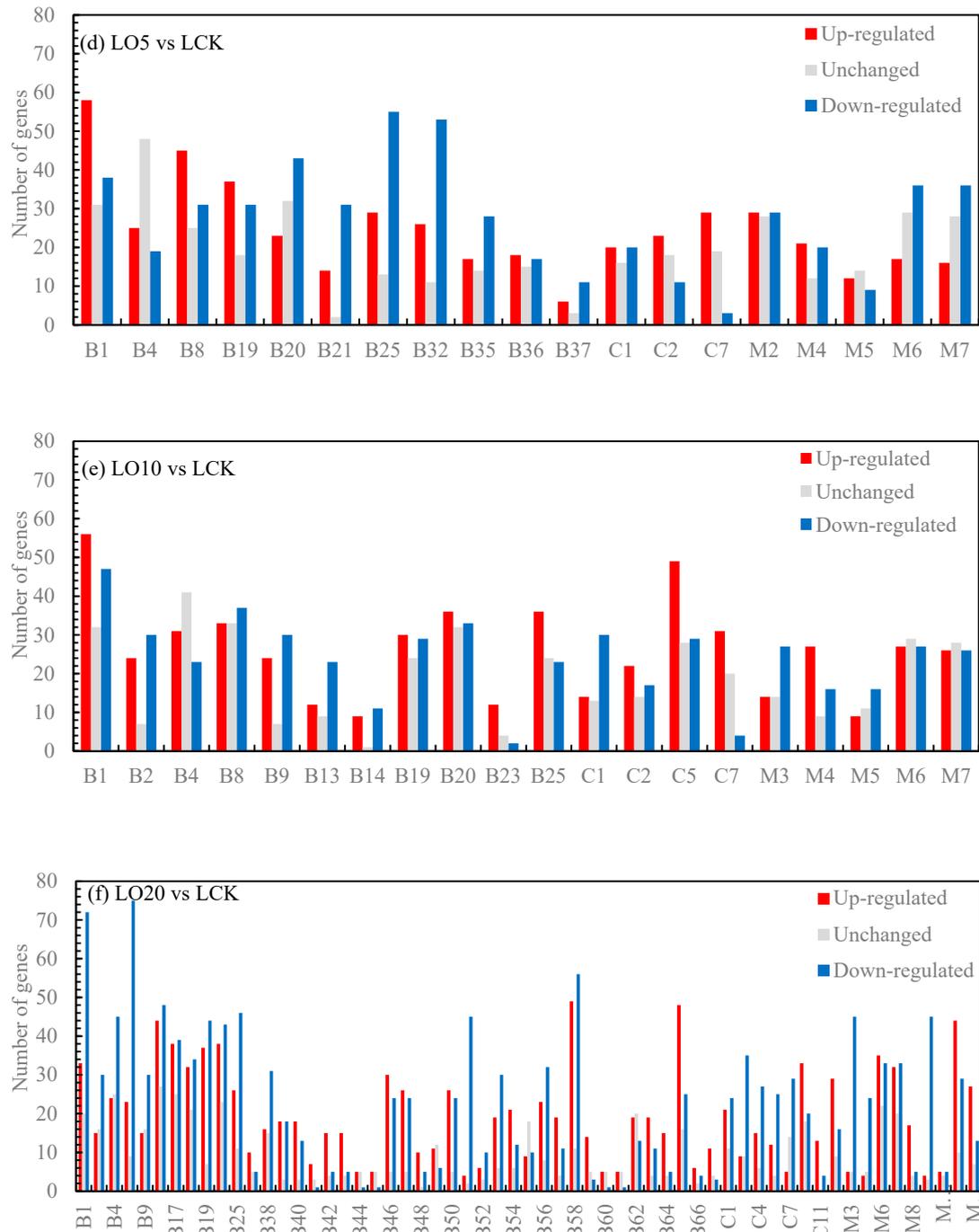
**Figure 2.** Volcano map of differentially expressed genes. Note: The horizontal coordinate is  $\log_2(\text{fold change})$ , that is, the pair value of the fold change value; The ordinate is  $-\log_{10}(\text{padj})$ , which is the inverse of the logarithm of the corrected p-value.

### 3.5.3. Functional analysis of differentially expressed gene Gene Ontology (GO)

The functional significance enrichment analysis of GO identifies the significantly enriched GO functional items in the differentially expressed genes compared to the genomic background, thereby determining which biological functions are significantly correlated with these genes. Firstly, all differentially expressed genes were mapped to each term in the Gene Ontology database, and the gene count for each term was calculated. Subsequently, it was observed that the differentially expressed genes exhibited significant enrichment compared to the entire genome background. The enricher function of clusterProfiler utilizes a hypergeometric distribution test as part of its GO enrichment analysis method to identify significantly enriched GO Terms ( $P_{\text{adj}} \leq 0.05$ ). Based on the

results of this analysis, three categories of GO (biological process, cellular component and molecular function) were used to calculate separately the number of up-regulated genes, down-regulated genes, and total genes within each category (as shown in Figure 3). In Figure 3(a), metabolic process, plastid nucleoid, and alcohol binding had the highest number of up-regulated genes. In Figure 3(b), chlorophyll metabolic process and regulation of dephosphorylation had a higher number of up-regulated genes along with tubulin complex and alcohol binding. In Figure 3(c), regulation of dephosphorylation, cajal body, tubulin complex along with alcohol binding showed a higher count for up-regulated genes. Similarly in Figure 3(d), metabolic process along with tubulin complex and alcohol binding displayed a higher count for up-regulated genes. In Figure 3(e), metabolic process together with plastid nucleoid and phosphatase regulator activity exhibited a higher number for up-regulated genes. Lastly in Figure 3(f), sesquiterpenoid metabolic process demonstrated the largest count for up-regulated genes followed by protein phosphatase type 2A complex and protein histidine kinase binding.





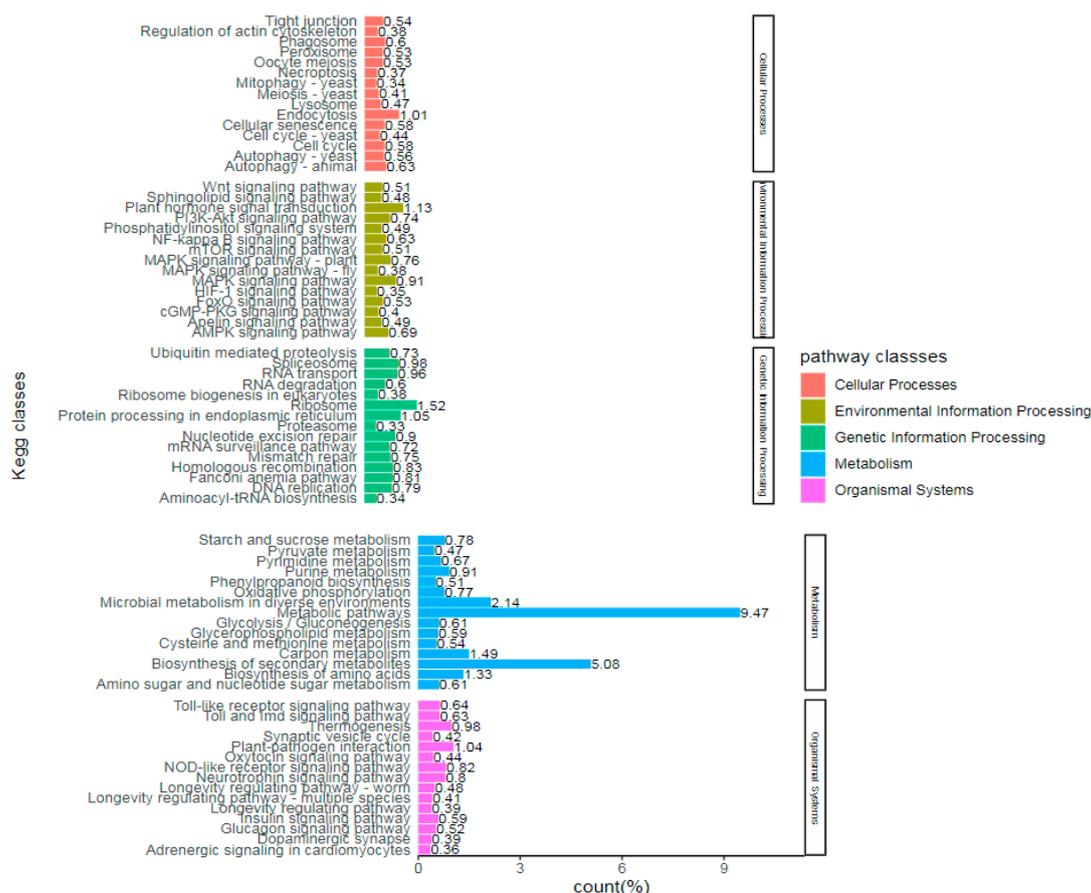
**Figure 3.** GO enrichment histogram of differential genes. Note: B: Biological process; C: Cellular component; M: Molecular function; B1: Chlorophyll metabolic process; B2: Chloroplast fission; B3: Circadian regulation of gene expression; B4: Clathrin-dependent endocytosis; B5: Ethanolamine-containing compound metabolic process; B6: Maltose metabolic process; B7: Peptidyl-histidine modification; B8: Photosynthesis, light harvesting; B9: Plastid fission; B10: Positive regulation of histone H3-K27 methylation; B11: Positive regulation of protein import; B12: Positive regulation of protein import into nucleus; B13: Positive regulation of protein localization to nucleus; B14: Primary miRNA processing; B15: Regulation of dephosphorylation; B16: Regulation of histone H3-K27 methylation; B17: Regulation of phosphatase activity; B18: Regulation of phosphoprotein phosphatase activity; B19: Regulation of photosynthesis, light reaction; B20: Regulation of protein dephosphorylation; B21: Systemic acquired resistance, salicylic acid mediated signaling pathway; B22: Cell plate formation involved in plant-type cell wall biogenesis; B23: Cellular response to gravity;

B24: Galacturonate biosynthetic process; B25: Photosynthetic electron transport chain; B26: Spindle assembly involved in meiosis; B27: Plastid transcription; B28: Plastid translation; B29: Regulation of protein localization to nucleus; B30: Regulation of transcription from RNA polymerase II promoter in response to stress; B31: Ribosomal protein import into nucleus; B32: Salicylic acid mediated signaling pathway; B33: Regulation of defense response to oomycetes; B34: Regulation of generation of precursor metabolites and energy; B35: Induced systemic resistance, jasmonic acid mediated signaling pathway; B36: Regulation of DNA methylation; B37: Regulation of miRNA metabolic process; B38: Cell plate assembly; B39: Cellular response to disaccharide stimulus; B40: Cellular response to sucrose stimulus; B41: Ciliary basal body-plasma membrane docking; B42: Lateral growth; B43: Negative regulation of iron ion transport; B44: Negative regulation of lipoprotein particle clearance; B45: Negative regulation of low-density lipoprotein particle clearance; B46: Negative regulation of photosynthesis; B47: Negative regulation of photosynthesis, light reaction; B48: Nuclear-transcribed mRNA catabolic process, 3'-5' exonucleolytic nonsense-mediated decay; B49: Peptidyl-serine dephosphorylation; B50: Photoinhibition; B51: Photosynthesis, light harvesting in photosystem I; B52: Photosynthetic electron transport in photosystem II; B53: Photosystem II repair; B54: Positive regulation of histone H3-K27 methylation; B55: Positive regulation of protein import; B56: Protein repair; B57: Regulation of chlorophyll catabolic process; B58: Regulation of generation of precursor metabolites and energy; B59: Regulation of histone H3-K9 dimethylation; B60: Regulation of lipoprotein particle clearance; B61: Regulation of low-density lipoprotein particle clearance; B62: Regulation of protein import; B63: Regulation of tetrapyrrole catabolic process; B64: Secondary growth; B65: Sesquiterpenoid metabolic process; B66: Spindle assembly involved in meiosis; B67: Visual behavior; C1: Cajal body; C2: Chloroplast thylakoid membrane protein complex; C3: Chromatin silencing complex; C4: Cytoplasmic chromosome; C5: Plastid nucleoid; C6: Transcription repressor complex; C7: Tubulin complex; C8: Light-harvesting complex; C9: Thylakoid light-harvesting complex; C10: Protein phosphatase type 2A complex; C11: Ski complex; C12: Transcriptionally active chromatin; M1: Abscisic acid binding; M2: Alcohol binding; M3: Chlorophyll binding; M4: Isoprenoid binding; M5: Methionine adenosyltransferase activity; M6: Phosphatase regulator activity; M7: Protein phosphatase regulator activity; M8: Cytokinin receptor activity; M9: Pigment binding; M10: Protein C-terminal methyltransferase activity; M11: Protein histidine kinase binding; M12: Pyrophosphate hydrolysis-driven proton transmembrane transporter activity.

#### 3.5.4. KEGG annotation and enrichment analysis of differentially expressed genes

##### (1) KEGG annotation of differentially expressed genes

Pathway enrichment analysis enables the identification of crucial biochemical metabolic pathways and signal transduction pathways associated with differentially expressed genes. KEGG (Kyoto Encyclopedia of Genes and Genomes) serves as the primary public database for Pathway information, integrating genome chemistry and system function data. The unit of analysis in pathway significant enrichment analysis is KEGG Pathway. A hypergeometric test was employed to identify pathways where differential genes were significantly enriched compared to all annotated genes. Similarly, a padj threshold less than 0.05 was used to determine significant enrichment in KEGG pathway analysis. Figure 4 illustrates the proportion of annotated genes and included pathways by comparing unigene with the KEGG database.



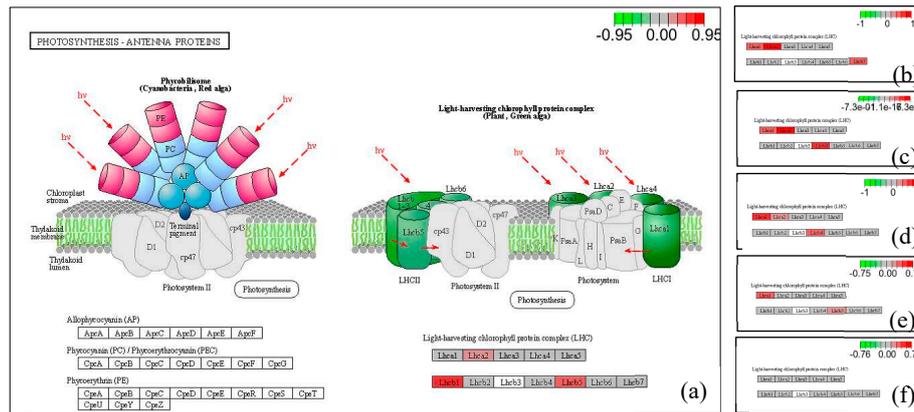
**Figure 4.** KEGG metabolic pathway classification statistics. Note: The ordinate is the annotated KEGG pathway, and the abscissa is the proportion of genes annotated to the pathway.

## (2) Enrichment of KEGG pathway diagram

The pathway map illustrating the enrichment of differentially expressed genes is presented in Figure 5. To visualize the distribution of these genes within the pathway map, differential genes were annotated, with red indicating up-regulated genes and green representing down-regulated genes.

The light-harvesting protein complex in the pathway of light-antenna proteins comprises both up-regulated and down-regulated genes. The chlorophyll-binding subunits of photosystems I and II serve as internal antenna light-harvesting proteins for oxygenic photosynthesis. In cyanobacteria, phycobilisomes contain antenna proteins, while green plants possess light-harvesting chlorophyll protein complexes acting as peripheral antenna systems to enhance the efficiency of light energy absorption.

The expression of LHca2 (light-harvesting complex I chlorophyll a/b binding protein 2) was up-regulated in LN5 compared to LCK. Additionally, LHcb1 (light-harvesting complex II chlorophyll a/b binding protein 1) showed an increase in expression, as well as LHcb5 (light-harvesting complex II chlorophyll a/b binding protein 5). In LN10 vs LCK, there was an up-regulation of LHca1 (light-harvesting complex I chlorophyll a/b binding protein 1), along with the up-regulation of LHca2 and LHcb7 (light-harvesting receptor complex II chlorophyll a/b binding protein 7). Similarly, in LN20 vs LCK, there was an up-regulation of LHca1, along with the up-regulation of LHca2 and LHcb4 (light-trapping complex II chlorophyll a/b binding protein). Furthermore, in LO5 vs LCK, there was an up-regulation of LHca1. Specifically, there was an increase in the expression of chlorophyll a/b binding protein 2 or namely known as LHca2. Moreover, both LHcb1 and Lhcb2 were found to be up-regulated. Lastly, both LHcb4 and LHcb6 exhibited increased expression levels. In LO10 vs LCK specifically showed an increase in the expression level for LHca1 while also showing increased levels for LHcb5.



**Figure 5.** Pathway diagram of KEGG enrichment analysis (a: LO5 vs LCK, b: LO10 vs LCK, c: LO20 vs LCK; d: LN5 vs LCK; e: LN10 vs LCK, f: LN20 vs LCK). Note: red indicates that the KO node contains up-regulated genes, and green indicates that the KO node contains down-regulated genes.

### 3.5.5. Weighted geneco-expression network analysis (WGCNA)

In order to identify gene co-expression modules, a weighted gene co-expression network analysis (WGCNA) was conducted for all expressed genes. Firstly, the coexpression network was constructed based on the transcriptome sequencing results using a defined fitting index  $R^2 = 0.8$ . Low expression genes were excluded and the cluster of coexpressed genes was dynamically cut. A cluster tree was then generated according to the correlation between gene expression levels (Figure 6), resulting in module divisions. Each color in the figure represents a specific module that includes genes belonging to the same cluster in the clustering tree. If certain genes consistently exhibit similar changes in expression during a physiological process or across different tissues, it suggests their functional relationship and they can be defined as a module. The vertical distance reflects the dissimilarity between two nodes (genes). The correlation heat map between modules (Figure 7) can be divided into two parts: the upper part clusters modules based on their eigengene values, while each row and column in the bottom half represents an individual module. Blue indicates negative correlation with a coefficient ranging from 0 to 0.5; closer values to zero indicate stronger negative correlations. Red indicates positive correlation with coefficients ranging from 0.5 to 1; closer values to one indicate stronger positive correlations. The results demonstrated a significant correlation of 0.749 between the Coral module and Darkturquoise module, thereby establishing these two modules as potential target gene modules. Subsequently, an independent analysis was conducted on the expression levels of all genes and eigenvector genes within the two modules across all samples. It was observed that the gene expression levels within each module exhibited a high degree of correlation, while the expression levels of eigenvector genes were also strongly correlated with the overall expression level of their respective modules. This finding suggests that eigenvector genes in target modules can effectively represent the overall gene expressions within their corresponding modules (Figure 8). Finally, hub genes from the two modules were selected based on their connectivity ranking with other genes; specifically, those with higher  $k_{Within}$  rankings indicating central hub positions were chosen. The Darkturquoise module yielded five core genes, while the Coral module identified four core genes, resulting in a total of hub core genes (LOC103857346, Actin-related protein 2/3 complex subunit 1A; LOC103828797, Actin-related protein 2/3 complex subunit 2A; LOC103874199, Superoxide dismutase [Fe] 3; LOC103838242, Monodehydroascorbate reductase; LOC103846588, Thioredoxin M2; LOC103873206, ABC transporter A family member 7; LOC106353797, ABC transporter B family member 26; LOC103859979, ATP sulfurylase 1; LOC103859070, Cysteine synthase D1) associated with the antioxidant stress, absorption, transport, and metabolism of selenium. Real-time fluorescence quantitative PCR was conducted to validate these nine hub genes, as depicted in Figure 9.

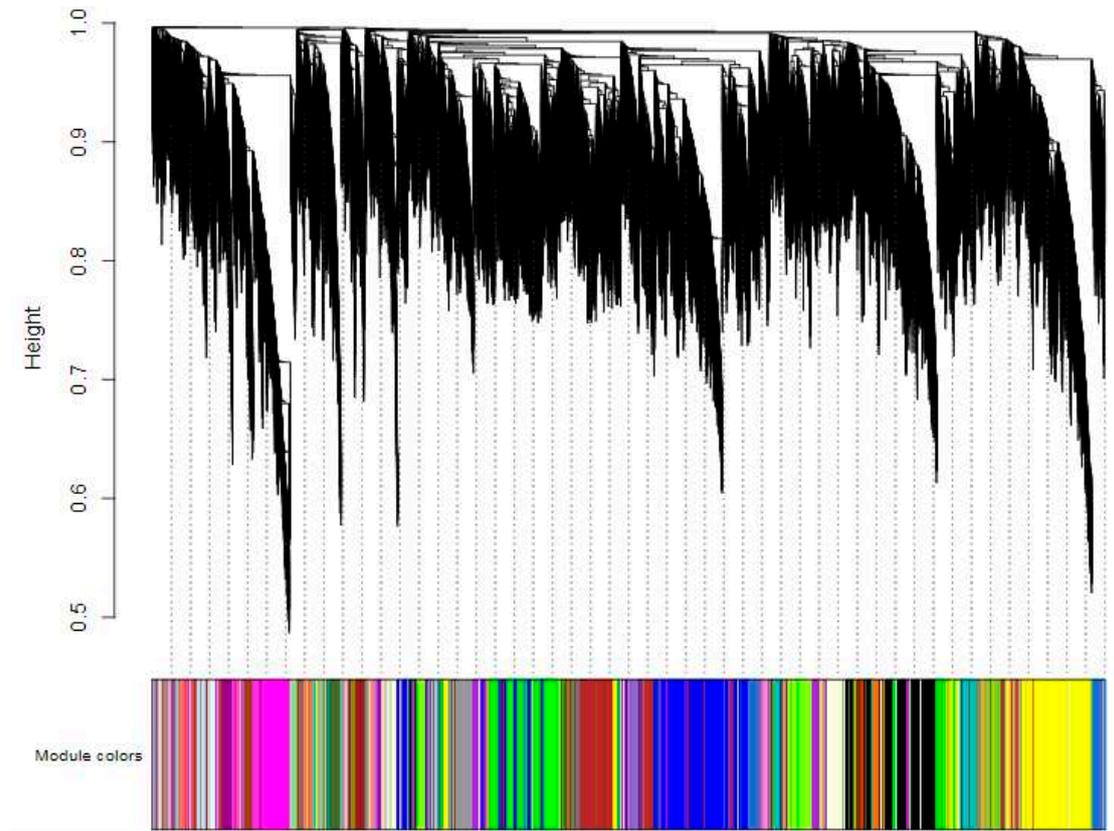


Figure 6. Hierarchical clustering tree.

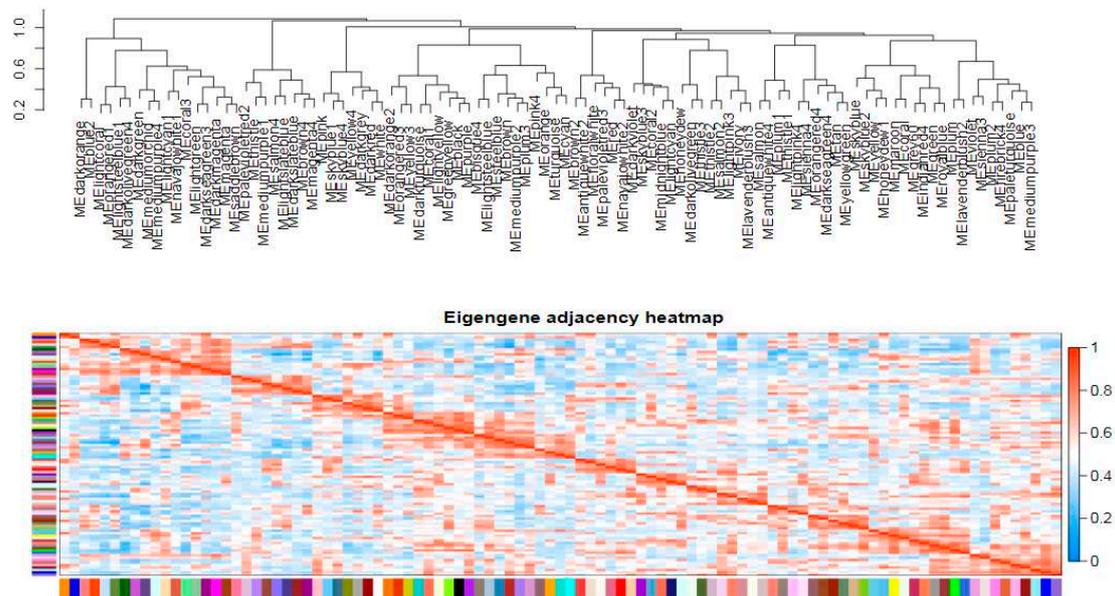
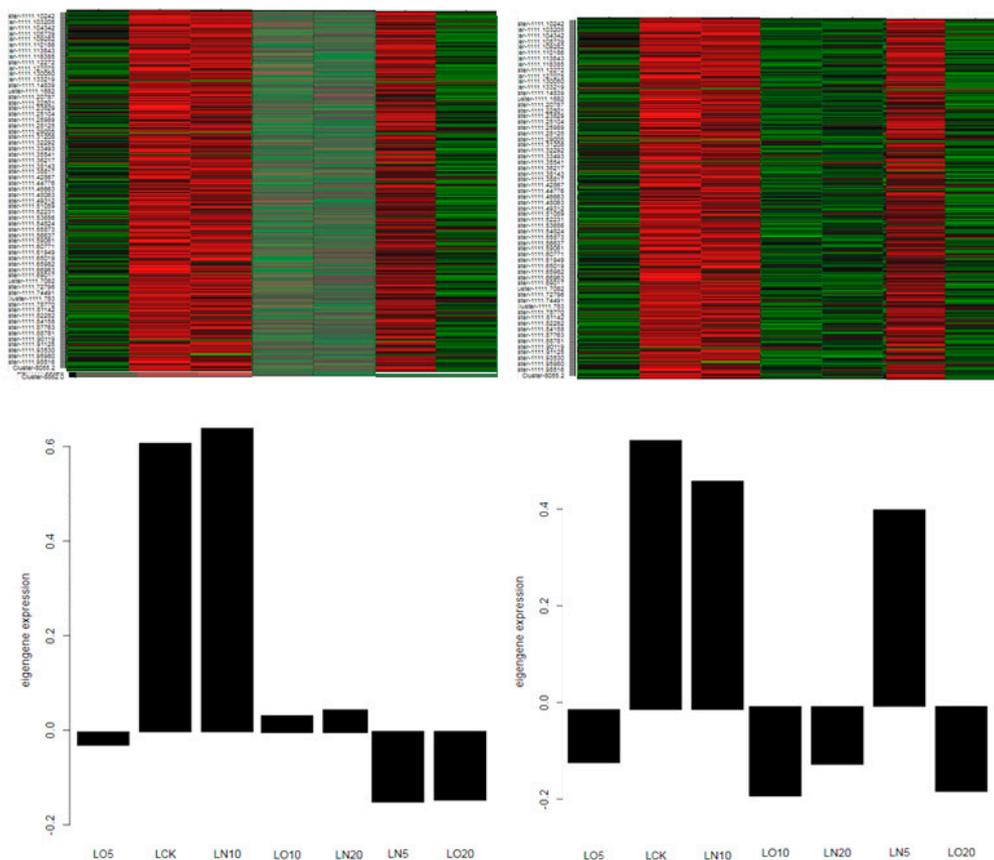


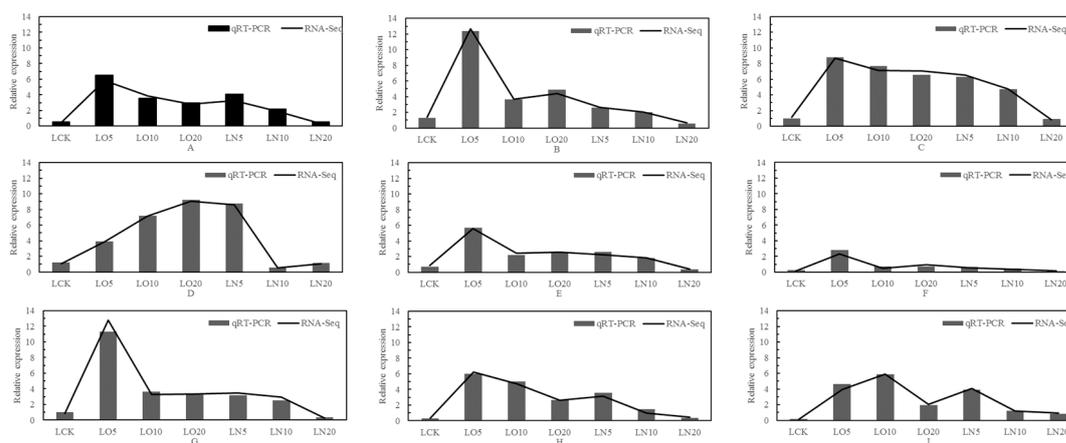
Figure 7. Module eigengene correlation between different modules of WGCNA.



**Figure 8.** Expression levels of all genes and corresponding module eigengene in MEDarkturquoise (left) module and Coral (right) module.

### 3.5.6. Fluorescence quantitative PCR analysis

The differential genes were validated using qRT-PCR, and the mapping analysis yielded an high  $R^2$  value calculated based on the  $2^{-\Delta\Delta C_t}$  method. The concordance between the qRT-PCR validation and RNA-Seq results demonstrated the reliability of the experimental findings (Figure 9).



**Figure 9.** qRT-PCR identification and RNA-Seq analysis. Note: A: LOC103857346, Actin-related protein 2/3 complex subunit 1A; B: LOC103828797, Actin-related protein 2/3 complex subunit 2A; C: LOC103874199, Superoxide dismutase [Fe] 3; D: LOC103838242, Monodehydroascorbate reductase; E: LOC103846588, Thioredoxin M2; F: LOC103873206, ABC transporter A family member 7; G: LOC106353797, ABC transporter B family member 26; H: LOC103859979, ATP sulfurylase 1; I: LOC103859070, Cysteine synthase D1.

### 3.5.6. Differential gene function analysis

#### (1) Genes related to selenium absorption - endocytosis

Endocytosis is a cellular mechanism employed for the acquisition of extracellular nutrients. Further analysis showed that endocytosis included not only the hub genes (LOC103857346, Actin-related protein 2/3 complex subunit 1A; LOC103828797, Actin-related protein 2/3 complex subunit 2A), but also other genes as shown in Table 5. Transcriptome analysis revealed 32 differentially expressed genes associated with endocytic proteins, as presented in Table 5. Notably, Actin-related protein 2/3 complex subunit 1A, nuclear-pore anchor, and vacuolar protein sorting-associated protein exhibited enhanced expression upon treatment with organic selenium and nano-selenium 2 homolog 3, along with upregulation observed in vacuolar protein sorting-associated protein 28 homolog 2 and Vacuolar protein sorting-associated protein 60. This suggests that endocytosis may facilitate the absorption of selenium.

**Table 5.** The related gene in endocytosis.

Gene name	Transcripts Per Kilobase Million (TPM)							Function
	LCK	LO5	LO10	LO20	LN5	LN10	LN20	
LOC103857346	0	43.1	72.6	15.4	75	121	55	Actin-related protein 2/3 complex subunit 1A
LOC103828797	25	24.8	19.5	11.2	21.8	0	17.7	Actin-related protein 2/3 complex subunit 2A
LOC103838512	187	62.1	97.2	146	191	229	70.8	Actin-related protein 2/3 complex subunit 3
LOC103863562	18.5	9.9	5.04	0	11.5	0	19.8	Actin-related protein 2/3 complex subunit 4
LOC103829270	723	667	236	242	432	360	389	ADP-ribosylation factor 2-B
LOC103834200	223	230	138	47.7	152	246	167	ADP-ribosylation factor GTPase-activating protein AGD12
LOC103838481	4.56	0	2	0	0	1.37	3.9	ADP-ribosylation factor GTPase-activating protein AGD2
LOC103845528	67.72	112.4	44.77	40.66	49.35	51.99	19.62	AP-2 complex subunit alpha-1
LOC103853730	393	273	278	246	350	337	264	AP-2 complex subunit mu
LOC103859264	15	16	11	2	16	23	12	Clathrin heavy chain 2
LOC103839878	262	61.5	0	114	123	101	5.6	E3 ubiquitin-protein ligase UPL5
LOC103836651	95.1	35.6	50.4	53.4	0	35.3	60.6	EH domain-containing protein 1
LOC103831794	318	211	169	729	288	154	217	ESCRT-related protein CHMP1B
LOC103859096	390	425	369	149	405	360	365	F-actin-capping protein subunit alpha
LOC103830490	0	3	1	18	0	1	0	Nuclear-pore anchor
LOC103848932	7.79	0	12.1	0	4	0	3.39	Phosphatidylinositol 4-phosphate 5-kinase 6
LOC103831688	38.4	0	33.7	0	1.08	0	0	Probable F-actin-capping protein subunit beta

LOC103840633	79.5	4.75	21.9	11.3	20.2	39.7	50.4	Probable mediator of RNA polymerase II transcription subunit 37e
LOC103866553	730	42.7	0	684	363	46	39.1	Protein homolog of mammalian lyst-interacting protein 5
LOC103827815	42	39	32	31	34	28	19	Ras-related protein RABF2a
LOC125608966	154	0	148	0	49.8	108	142	Ras-related protein RABG3f
LOC103827890	0	0	2	0	0	0	0	Vacuolar protein sorting-associated protein 2 homolog 2
LOC103844298	0	16.3	6.77	0	15.9	17.3	9.31	Vacuolar protein sorting-associated protein 2 homolog 3
LOC103847195	130	271	106	106	258	107	137	Vacuolar protein sorting-associated protein 20 homolog 2
LOC103861671	0	1.25	0	0	0	0	0	Vacuolar protein sorting-associated protein 22 homolog 1
LOC103857037	13.9	7.68	18.1	39.2	13.8	3.77	22.8	Vacuolar protein sorting-associated protein 25
LOC103839783	22	25	39	102	38	18	44	Vacuolar protein sorting-associated protein 28 homolog 2
LOC103853808	806	406	455	701	1167	590	468	Vacuolar protein sorting-associated protein 32 homolog 2
LOC103847243	365	329	418	858	239	278	456	Vacuolar protein sorting-associated protein 36
LOC103853060	312	196	501	171	240	267	217	Vacuolar protein sorting-associated protein 45 homolog
LOC103859354	29.8	55.7	51.5	33.7	97.1	62.8	62.2	Vacuolar protein sorting-associated protein 60.1
LOC103863440	0	1.25	0	0	0	0	0	Vacuolar protein-sorting-associated protein 37 homolog 1

## (2) Genes involved in antioxidant stress

Low temperature can induce the generation of Reactive Oxygen Species (ROS) in plants, and excessive ROS accumulation can trigger cell apoptosis. To enhance the ROS response, plants up-regulate the expression of antioxidant coding genes, promote antioxidants biosynthesis, and thereby improve their antioxidant capacity. In addition to the hub genes mentioned above, there are other genes involved in antioxidant activity. In both organic selenium and nano-selenium treatment groups, superoxide dismutase (SOD), superoxide dismutase [Fe] 3, superoxide dismutase [Fe] 2, monodehydroascorbate reductase, and thioredoxin M2 were upregulated significantly, playing a crucial role in combating oxidative stress caused by low temperature in leaves (Table 6).

**Table 6.** Genes involved in antioxidative stress.

Gene name	Transcripts Per Kilobase Million (TPM)							Function
	LCK	LO5	LO10	LO20	LN5	LN10	LN20	
LOC103874199	30.28	19.88	57.58	0	51.84	59.11	19.66	Superoxide dismutase [Fe] 3
LOC103857203	386	441	791	251	798	332	458	Superoxide dismutase [Fe] 2
LOC103838242	0	214.58	7.63	0	33.25	14.4	0	Monodehydroascorbate reductase
LOC103846588	4.08	9.16	6.09	0	20.4	3.19	4.52	Thioredoxin M2

### (3) Selenium transport-related gene ----ABC transporter

The ABC transporter plays a crucial role in the cell membrane by facilitating the transport of substances across the cell or extracellular space through ATP. In addition to the aforementioned hub genes, there exist additional genes implicated in the transportation of selenium. Comparative analysis revealed differential expression of 23 ABC transporter genes, with upregulation observed for ABC transporter B family member 29, ABC transporter C family member 10, ABC transporter E family member 2, ABC transporter G family member 11, ABC transporter G family member 40, and ABC transporter I family member 1.

**Table 7.** The genes of ABC transporter gene family.

Gene name	Transcripts Per Kilobase Million (TPM)							Function
	LCK	LO5	LO10	LO20	LN5	LN10	LN20	
LOC103873206	824.4	630.78	496.96	128.14	582.37	345.51	431.95	ABC transporter A family member 7
LOC106353797	2169.8	2721	1746.08	1866	2128.89	1854	1048.58	ABC transporter B family member 26
LOC103847350	15.2	30.03	0	40.27	14.82	18.59	24.13	ABC transporter B family member 29
LOC103866318	296.88	203.33	710.22	204.74	559.52	133.95	153.34	ABC transporter B family member 4
LOC103867037	266.9	216.14	115.52	311.32	258.27	197.28	109.8	ABC transporter B family member 6
LOC103841771	182.07	436	721	291.67	1832	488.35	665.6	ABC transporter C family member 10
LOC103868683	328.47	155.67	263.61	375.64	412.3	209.69	223.52	ABC transporter C family member 4
LOC103838010	394.11	449.39	79.4	308.17	497.77	513.89	135.88	ABC transporter C family member 5
LOC103869976	980.68	1062.82	450.92	526.92	857.17	772.79	0	ABC transporter D family member 2
LOC103869976	0	5	1	0	0	0	1.02	ABC transporter D family member 2
LOC103865536	0	0	0	34.46	0	31.82	6.76	ABC transporter E family member 2
LOC103857266	0	5.19	306	0	628.18	324.33	0	ABC transporter E family member 2
LOC103851055	0	0	0	456.64	314.58	47.79	0	ABC transporter F family member 1
LOC103867761	10.94	0	1.95	30.92	0	20.46	7.7	ABC transporter G family member 1
LOC103835938	674.37	334.08	1137.08	801.13	939.33	1435.65	800.87	ABC transporter G family member 11
LOC103867209	0	0	0	11.45	0	0	76.09	ABC transporter G family member 33
LOC103872310	4.97	0	0	0	0	1.65	0	ABC transporter G family member 35
LOC103872346	120	632	245	368	32	402	212	ABC transporter G family member 40
LOC103872346	44.06	247.04	33.05	111.63	0	141.49	45.11	ABC transporter G family member 40
LOC103832795	5693.61	1452.2	4726	640.2	0	3356.75	2220.56	ABC transporter G family member 7
LOC103838079	25.13	0	66	53.12	42.03	73	0	ABC transporter I family member 1
LOC103847034	126	0	0	78.17	0	0	170.22	ABC transporter I family member 10
LOC103859358	7	3	6	0	5	0	1	ABC transporter I family member 6

### (4) Genes related to selenium metabolism

The metabolic pathways of cysteine and methionine, sulfur, selenide, and glutathione, which are closely associated with selenium metabolism, were analyzed. The subsequent analysis revealed that selenium metabolism involved not only the hub genes but also other genes, as indicated in Table 8. After selenium absorption, the expression of genes related to the sulfur metabolic pathway was either up-regulated or down-regulated. The expression of chloroplastic ATP-ylase 1 genes was up-regulated following treatment with organic selenium and nano-selenium. Key genes controlling the expression of Cysteine synthase showed varying degrees of up-regulation, with LN5 Transcripts TPM exhibiting the highest value. Furthermore, it was observed that genes involved in selenide

metabolism-related enzymes were up-regulated. These included glutathione S-transferase U12 and S-sulfo-L-cysteine synthase (O-acetyl-L-serine-dependent). On the other hand, glutathionyl-hydroquinone reductase YqjG and probable glutathione peroxidase 8 were down-regulated. In summary, there was a higher overall abundance of up-regulated gene expression compared to down-regulated gene expression, and significant differences in gene expression levels were observed between organic selenium and nano-selenium treatments. Notably, under nano-selenium treatment conditions, certain key genes exhibited significantly higher expression levels than under organic selenium treatment conditions, indicating a superior absorption effect for nano-selenium.

**Table 8.** Selenium metabolism related genes.

Gene name	Transcripts Per Kilobase Million (TPM)							Function
	LCK	LO5	LO10	LO20	LN5	LN10	LN20	
LOC103859979	385	820	667	601	2072	935	820	ATP sulfurylase 1
LOC103859070	0	32.81	12.43	18.59	128.88	9.64	7.02	Cysteine synthase D1
LOC103873728	53.22	12.86	20.8	0	0	0	0	Glutaredoxin-C1
LOC103834501	1.48	0	3.32	0	34.39	9.1	5.9	Glutaredoxin-C6
LOC103831537	1.09	406	76.93	52.03	0	90.99	221.85	Glutathione S-transferase U12
LOC103848467	338.38	278.31	268.22	0	80.84	332.68	163.07	Glutathionyl-hydroquinone reductase YqjG
LOC103838277	245.06	71.83	35.63	14.66	160.63	93.06	51.59	Probable glutathione peroxidase 8
LOC103828203	387	580	338	150	419	349	331	S-sulfo-L-cysteine synthase (O-acetyl-L-serine-dependent)

## 4. Discussion

### 4.1. Effects of spraying organic selenium and nano-selenium fertilizer on leaf photosynthesis under low temperature stress

Studies have indicated that the photosynthetic process of plants is negatively impacted by low temperature stress. The original chlorophyll undergoes destruction due to low temperatures, leading to a decrease in chlorophyll content (Yang et al., 2022). Consequently, the photosynthetic capacity of plants weakens, hindering carbon assimilation and retarding plant growth rate (Tang, 2011). Application of an appropriate concentration of selenium can regulate porphyrin biosynthesis in plants, thereby influencing chlorophyll metabolism (Zhong et al., 2017). Moreover, an optimal selenium concentration facilitates the absorption of P, K, Ca, Mg and other elements by crops. Most of these elements actively participate in or promote the synthesis process of chlorophyll (Han and Wei, 2015) while regulating photosynthesis. Results demonstrate that under low temperature stress conditions, foliar application with suitable concentrations of organic selenium (20 mg L<sup>-1</sup>) and nano-selenium (10 mg L<sup>-1</sup>) significantly enhances leaf chlorophyll content. Furthermore, this study reveals that spraying organic selenium (20 mg L<sup>-1</sup>) and nano-selenium (10 mg L<sup>-1</sup>) substantially increases the chlorophyll a/b ratio—a finding consistent with Zhang et al.'s research on grapes in 2018 and Hu et al.'s investigation on purple potatoes in 2019. The increase in the chlorophyll a/b ratio indicates an enhancement in the stacking degree of thylakoid membranes within chloroplasts, thereby improving the efficiency of light energy conversion through enhanced absorption, transfer, and utilization of photons by plants. Additionally, it was observed that lower concentrations led to a significant increase in organic selenium carotenoid content, while carotenoid content initially increased and then decreased with increasing nano-selenium concentration. This suggests that an appropriate selenium concentration can promote carotenoid synthesis to some extent and protect plant chlorophyll molecules from photooxidation damage, which aligns with Wang 's (2019) research on cress and mustard.

### 4.2. Effects of spraying organic selenium and nano-selenium fertilizer on the regulation of antioxidant system of leaves under low temperature stress

The regulation of selenium on the plant antioxidant system: Secondary metabolites, such as ascorbic acid (ASA) and plant phenolic compounds (TP), are commonly recognized as non-enzymatic substances possessing potent antioxidant capacity. The ascorbate-glutathione cycle (ASA-GSH cycle)

represents a highly efficient detoxification pathway in both the cytoplasm and chloroplasts of plants. ASA exhibits the capability to donate electrons for numerous antioxidant reactions within the organism. Superoxide dismutase (SOD) serves as the primary defense against superoxide anions by catalyzing their dismutation into oxygen and hydrogen peroxide. Additionally, catalase (CAT) and peroxidase (POD) further decompose  $H_2O_2$  to prevent oxidative damage to plant cells. Song et al. (2019) demonstrated that lettuce seedlings could mitigate membrane lipid peroxidation damage under low temperature stress by increasing the activities of superoxide dismutase (SOD) and peroxidase (POD). Similarly, Wang et al. (2019) revealed that suitable spraying concentrations of nano-selenium fertilizer enhanced SOD and POD activities. This study reveals that different concentrations of organic selenium spray improved the activities of POD, SOD, and catalase (CAT) in leaves to varying degrees under low temperature stress, with the optimal concentration being  $20 \text{ mg L}^{-1}$ . Conversely, lower concentrations of nano-selenium fertilizer decreased the activity of these three enzymes in leaves under low temperature stress; however, their activity increased with higher concentrations. Additionally, this study found that ascorbate peroxidase content increased to varying degrees with increasing organic selenium concentration during low temperature stress, reaching its peak at a concentration of  $5 \text{ mg L}^{-1}$  and again at  $20 \text{ mg L}^{-1}$ . As for nano-selenium concentration, ascorbate peroxidase content also increased to different extents and reached its maximum at a concentration of  $20 \text{ mg L}^{-1}$ .

#### *4.3. Effects of spraying organic selenium and nano-selenium fertilizer on leaf nutritional quality under low temperature stress*

Under low temperature stress, the levels of amino acids, soluble sugars, and flavonoids in plants are known to increase (Zhou et al., 2021). Huang et al. (2023) and Yuan et al. (2008) reported that under low temperature stress, the levels of soluble sugars and soluble proteins showed varying degrees of increase in small-seed coffee seedlings and spirulina. Adverse conditions weaken plant metabolic reactions while enhancing hydrolysis and weakening synthesis, leading to degradation of macromolecular compounds such as soluble proteins into amino acids, soluble sugars, peptides, etc. Additionally, metabolic disorders under adverse conditions result in an accumulation of excess oxygen free radicals within the plant body. Consequently, plants synthesize a large number of flavonoid substances to enhance free radical scavenging and antioxidant activity. This study demonstrated that leaves exhibited increased levels of soluble sugar, soluble protein, amino acid, and flavonoid content under low temperature stress with increasing concentrations of organic selenium up to  $20 \text{ mg L}^{-1}$ . The high concentration of organic selenium treatment may have affected the respiratory electron transport chain and tolerance to organic selenium stress in leaves, leading to the use of their own physiological metabolism to alleviate exogenous selenium stress (Liu et al., 2019). However, spraying with lower concentrations of nano-selenium ( $5 \text{ mg L}^{-1}$ ) significantly increased soluble sugar and amino acid contents, while spraying with  $10 \text{ mg L}^{-1}$  of nano-selenium significantly increased soluble protein and flavonoid contents. The increase in soluble protein content from nano-selenium spray was due to its direct participation in protein synthesis through selenocysteine (Se-Cys) and selenomethionine (Se-Met), which reduced cysteine (Cys) and methionine (Met) levels in free amino acids. Additionally, as a component of tRNA ribonucleic acid chains in plants that transport amino acids, selenium also influenced other free amino acids. Excessive concentrations of nano-selenium decreased free amino acid content; however, under optimal concentration treatment at  $10 \text{ mg L}^{-1}$ , the ability for nano-selenium to convert free amino acids into soluble proteins likely weakened but still resulted in an increase in soluble protein content. Further research is needed on this specific mechanism.

#### *4.4. Absorption of organic selenium and nano-selenium at different concentrations in leaves*

Currently, research on the absorption of inorganic selenium in plants primarily focuses on the mechanism of root absorption, while there is limited reporting on the absorption of organic selenium and nano-selenium in leaves. It has been speculated that transporters associated with plant cysteine methionine may be involved in certain processes of organic selenide absorption. Kong (2021)

discovered significant differences in genes related to the endocytosis process after treatment with nano-selenium compared to the control group. Therefore, it is hypothesized that millet's absorption of nano-selenium is linked to the endocytosis process, and further tests are needed to verify whether genes related to PIP5K, Hsc70, PLD, and ArfGAP are involved in millet's selenium uptake and how they participate in this process. This study concludes absorption of nano-selenium and organic selenium is associated with endocytosis, aligning with previous findings.

#### 4.5. Transport of different concentrations of organic selenium and nano-selenium in leaves

The study revealed that ABC transporters play a crucial role in promoting plant growth by facilitating the transportation of nutrients, hormones, lipids, secondary metabolites, metal ions, and foreign substances. Additionally, they contribute to disease resistance and response to stress in plants. Moreover, these transporters are involved in regulating ion channels. The ABCB subgroup transporters primarily function in transporting heavy metals and secondary metabolites for resistance purposes. On the other hand, the ABCC subfamily is responsible for transporting glutathione compounds. Byrne SL et al. (2010) reported that 28 ABC transporters in ryegrass may be associated with selenide accumulation. In the investigation of genes related to selenium absorption and metabolism in tea tree roots conducted by Hu et al. (2016), 16 key genes of ABC transporter were identified suggesting their potential involvement in selenate transport within roots. However, Kong et al. (2021) examined selenium response genes in millet leaves and found that out of 7 differential genes belonging to ABC transporter family, 5 were up-regulated while 2 were down-regulated contradicting previous studies' findings. These discrepancies might arise from variations observed among different species regarding the expression patterns of ABC transporters.

#### 4.6. Metabolism of different concentrations of organic selenium and nano-selenium in leaves

Usually, selenite is reduced to selenide by sulfite reductase or glutathione, and selenide can also be produced through various mechanisms such as methionol in the action of selenium-binding proteins. Subsequently, cysteine synthase catalyzes the conversion of selenide into selenocysteine (SeCys) (Terry et al., 2000). Kong (2021) discovered that key genes regulating the expression of Se-binding protein 1 and cysteine synthase were upregulated to varying degrees during this process. The key genes associated with cysteine synthase in this study exhibit similarities to those identified in previous research. Following the biosynthesis of selenocysteine, a portion of it undergoes further conversion into selenocysta by cystathionine-gamma-synthetase ( $C\gamma S$ ), which is subsequently decomposed into se-homocysteine (SeHCys) by cystathionine- $\beta$ -lyase (CBL). Finally, under the influence of cysteine methyltransferase (MET), it is transformed into selenomethionine (SeMet). Some synthetic SeCys and SeMet can substitute Cys and Met within plant protein chains, thereby influencing their structure and function (Hoewyk et al., 2008). Other non-protein selenium amino acids like Methylselenol and its derivatives, as well as non-amino acid selenides, can be generated through the action of methionin-gamma-lyase to mitigate the toxic effects exerted by SeMet on plants' growth processes (Whanger, 2002, 2004). Inserting SMT gene in *Arabidopsis Thaliana* resulted in an increased content of SeMSeCys along with enhanced tolerance towards selenium (Hugh et al., 2004). Hu did not detect any SMT genes in tea tree roots following selenium treatment, indicating that SMT is not implicated in selenium regulation (discovery and analysis of key genes for selenium uptake and metabolism in tea tree roots). Similarly, Tan (2009) found no differential expression of SMT due to selenium induction. In this study, while no SMT was identified, the crucial gene homocysteine S-methyltransferase was discovered, and it was observed that the selenocysteine S-methyltransferase gene CsSMT mRNA could interact with the homocysteine S-methyltransferase gene of *Arabidopsis thaliana* (2016). Furthermore, the upregulation of glutaredoxin-C1, glutaredoxin-C6 and glutathione S-transferase U12 suggests that selenium plays a role in regulating the synthesis of glutathione, cysteine and methionine which ultimately affects its accumulation.

## 5. Conclusions

In conclusion, this study concludes that spraying with appropriate concentrations of organic selenium (20 mg L<sup>-1</sup>) or nano-selenium (10 mg L<sup>-1</sup>) is a useful strategy for improving “Suzhouqing” tolerance to low temperature, and subsequently yield.

Moreover, the gene expression related to selenium absorption, transport and metabolism of Suzhouqing was systematically screened and analyzed by RNA-Seq. Among the gene ontology (GO) terms, Chlorophyll metabolic process and plastid nucleoid were prominent mainly in biological process and cellular components. KEGG showed different pathways such as endocytosis, plant hormone signal transduction, metabolic pathways, biosynthesis of secondary metabolites under comparative treatments. Based on the transcriptome data mentioned above, a Weighted Gene Co-expression Network Analysis (WGCNA) was employed to construct a network that associates with physiological traits related to stress resistance. Two highly correlated gene co-expression modules were identified, and within them, nine hub genes associated with endocytosis, antioxidant stress, absorption, transport, and metabolism of selenium were discovered. Functional annotation revealed their predominant involvement in the regulatory pathway of hypothermia stress. Subsequently, the nine hub genes were subjected to fluorescence quantitative PCR verification, and the results obtained were consistent with those from transcriptome sequencing. The study revealed that, in addition to the aforementioned hub genes enhancing the response of plants to low temperature stress, 32 differential genes related to endocytosis, 23 differentially expressed ABC transporter genes, also exerted an influence on crop growth. Furthermore, the upregulation of Superoxide dismutase, Monodehydroascorbate playing a crucial role in combating oxidative stress caused by low temperature. Moreover, the regulation of glutaredoxin-C1, glutaredoxin-C6 and glutathione S-transferase U12 suggests that selenium plays a role in regulating the synthesis of glutathione, cysteine and methionine which ultimately affects its accumulation.

The beneficial effects on yield and total selenium content under low temperature were attributed to (1) protection of photosynthetic pigments for enhancing photosynthetic capacity by the up-regulation of LHca2, LHcb1, LHca1, LHcb4 in KEGG pathway: photosynthesis-antenna proteins; (2) activation of antioxidant system for efficient ROS homeostasis such as SOD, POD and CAT by the genes such as Superoxide dismutase, Monodehydroascorbate and (3) selenium absorption by endocytosis, selenium transportation by ABC transporter gene family and selenium metabolism related genes such as Cysteine synthase, Glutaredoxin.

Therefore, these findings provide a foundation for further investigation into the molecular mechanisms underlying the effects of organic selenium and nano-selenium on cyanochloride production at low temperatures.

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