

# Comparative transcriptome profiling reveals the defense pathways and mechanisms in the leaves and roots of blueberry to drought stress

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## Abstract

Blueberry is an important horticultural plant that is very susceptible to drought. However, the molecular regulation mechanisms of blueberry tolerance to drought remain elusive. In this study, the transcriptome profile of blueberry by RNA-seq under different degrees of drought treatment were conducted and drought-related genes and pathways were screened using weighted gene co-expression network analysis (WGCNA) and Venn analysis. Interestingly, the leaves and roots of blueberry exhibited different expression patterns under drought treatment and differentially expressed genes (DEGs), GO terms and KEGG pathways were more enriched in leaves than in roots. The majority of DEGs were associated with signal transduction, transcriptional regulation, and metabolism. Eight key pathways and eight DEGs were shared both in leaves and roots. Notably, the pathway with the most core genes in leaves is the plant hormone signal transduction pathway, and in roots are the MAPK signaling pathway, reactive oxygen species metabolism and the key genes such as *VcXTH3*, *VcPP2C51*, and *VcPNC1* were identified. For transcription factors, *VcABR1*, *VcABF2*, *VcMYB108* and *VcMYB93* are likely involved in drought response. In the metabolism category, *VcCYP75A1* was likely involved in anthocyanin biosynthesis, and *VcPNC1* in the monoterpene biosynthesis pathway. The eight DEGs markedly induced under drought exhibited differential expression in leaves and roots. Correspondingly, physiological assays showed that POD activity, ABA content, and anthocyanin biosynthesis in leaves and roots were significantly increased. Collectively, our study revealed the synergistic and distinct defense pathways and mechanisms in leaves and roots of blueberry and explored the potential regulatory network in blueberry response to drought stress.

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## INTRODUCTION

Blueberry (*Vaccinium corymbosum*) is a perennial shrub of the genus *Vaccinium* of the Ericaceae. Its fruit is rich in anthocyanins and multiple bioactive substances that are beneficial to the human body<sup>[1]</sup>. In recent years, drought and water deficit have become the major constraints for agriculture production and blueberry industries with the frequency of extreme weather<sup>[2]</sup>. Blueberry is a shallow-rooted plant species that lacks root hairs and is vulnerable to drought stress<sup>[3]</sup>. Across the globe, the yield of blueberries has decreased by about 25%–30% due to drought stress<sup>[4]</sup>.

During the past decade, many studies on the molecular regulation network of plant tolerance to abiotic stress were reported by genome-wide transcriptional gene expression profiles<sup>[5]</sup>. It is feasible and effective to study the dynamic changes and regulatory mechanisms of plants' resistance to drought stress on transcriptional levels by RNA sequencing (RNA-seq)<sup>[6]</sup>. In sweet orange, 1764 transcripts showed significant variation under drought-stress treatment, with 1081 drought-induced and 683 drought-repressed genes<sup>[7]</sup>. In *Oryza sativa*, over 50% of *MYB* genes had different expression levels under drought stress<sup>[8]</sup>. Analysis of *NAC* genes in peanut under salt and drought stress by RNA sequencing revealed that the

expression of 43 *NAC* genes was up- or down-regulated under salt and drought stress<sup>[9]</sup>. Meanwhile, multiple potential key pathways and genes associated with drought tolerance have been identified on plant transcriptional levels using RNA-Seq combined with bioinformatics analysis. *Arabidopsis MYB15* and *MYB2* can be induced by drought stress, and activate dehydration-responsive genes such as *AtRD22* to positively regulate plant drought tolerance<sup>[10]</sup>. Overexpression of *AtMYB94* in *Arabidopsis* can improve drought tolerance by increasing the cuticle accumulation wax<sup>[11]</sup>. RNA-seq analysis of halophytic grass *Puccinellia nuttalliana* under salt treatment revealed that the transcription levels of genes such as *PIP2;2*, *HKT1;5*, and *ABF2* were significantly increased under NaCl treatment, suggesting that these genes are involved in salt stress responses<sup>[12]</sup>. In addition, overexpression of *ABF2* also increased the expression of ABA and stress-related genes to promote drought tolerance<sup>[13]</sup>. These results suggested that transcription factors universally participated in plant response to various kinds of stress and involved multiple signaling pathways during the process. To date, a variety of molecular mechanisms and the relevant signal networks involved in the drought stress response have been increasingly identified in a number of plant species. However, the potential pathways and mechanisms involved in blueberry response to drought stress remain

elusive.

The existing studies of blueberry drought tolerance are mostly concentrated at the physiological level. Most of the blueberry varieties are sensitive to drought stress, and the contents of ABA, total soluble sugar and proline in leaves show an increasing trend<sup>[14]</sup>, while the relative water content, gibberellin and polyamine content in leaves show a downward trend<sup>[3]</sup>. A recent study showed that the cuticle played an important role in limiting water loss in blueberry<sup>[15]</sup>. In view of the limited knowledge in blueberry tolerance to drought stress, it is necessary to reveal the molecular mechanisms and gene expression networks of blueberry in response to drought stress at the whole-plant level and genome-wide level.

In this study, the global transcriptome profile of the leaves and roots of blueberry under different drought treatments by RNA-seq were conducted and drought-related genes were analyzed using WGCNA and KEGG enrichment. Three main categories including signal transduction, transcriptional regulation and metabolism were enriched both in leaves and roots. MYB, AP2/ERF, and bZIP were identified as the key TFs families in blueberry response to drought stress. Eight key pathways including MAPK, ROS, plant hormone signal and eight DEGs were identified through PPI and Venn analysis. The eight key DEGs were markedly induced at different drought treatments and exhibited differential expression in leaves and roots. Moreover, these key genes were analyzed by KEGG annotation and combined with the physiological assays. Collectively, our study provides a genome-wide understanding of the molecular regulation network and mechanism of blueberry tolerance to drought, and a research basis and genetic resources for future research on blueberry cultivation in areas with insufficient soil moisture.

## RESULTS

### Phenotype and drought-responsive marker gene expression under different drought treatments

In this study, we assigned three different drought treatments based on SWC with CK (80.1%), MD (59.7%), and SD (30.1%) and the differences between the treatments were significant ( $P < 0.05$ ) (Fig. 1a, b). The RWC of blueberry leaves under the treatment of CK, MD, and SD were 86.3%, 65.3%, and 43.9%, respectively. As the degree of drought increases, the soil gradually loses water and cracks occur between the soil and the pot wall. At the same time, as the degree of drought treatment increases, the leaves shrank and turned red (Fig. 1c). It was reported that the CBF/DREB1 transcription factor (*CBF4*) in *Arabidopsis* and *Vitis vinifera* and ABA-dependent *RAB18* in *Arabidopsis*<sup>[16,17]</sup> controlled two critical pathways for drought tolerance in plants, and were considered to be drought-responsive marker genes of plants<sup>[18]</sup>. Therefore, we examined the expressions of *VcCBF4* and *VcRAB18* under different drought treatments and found that these two genes were significantly up-regulated with the increase of the degree of drought treatment. The expression level of *VcCBF4* in leaves and roots under MD treatment was 3.8 and 2.4 times that under CK treatment, respectively. The expression level of *VcRAB18* in leaves and roots under MD treatment was 3.1 times and 54.9 times that under CK treatment, respectively (Fig. 1d, e). The expressions of *VcCBF4* and *VcRAB18* induced by SD treatment were more evident than MD treatment, which indicated that

the assignment of drought treatment was reasonable and reliable in this study.

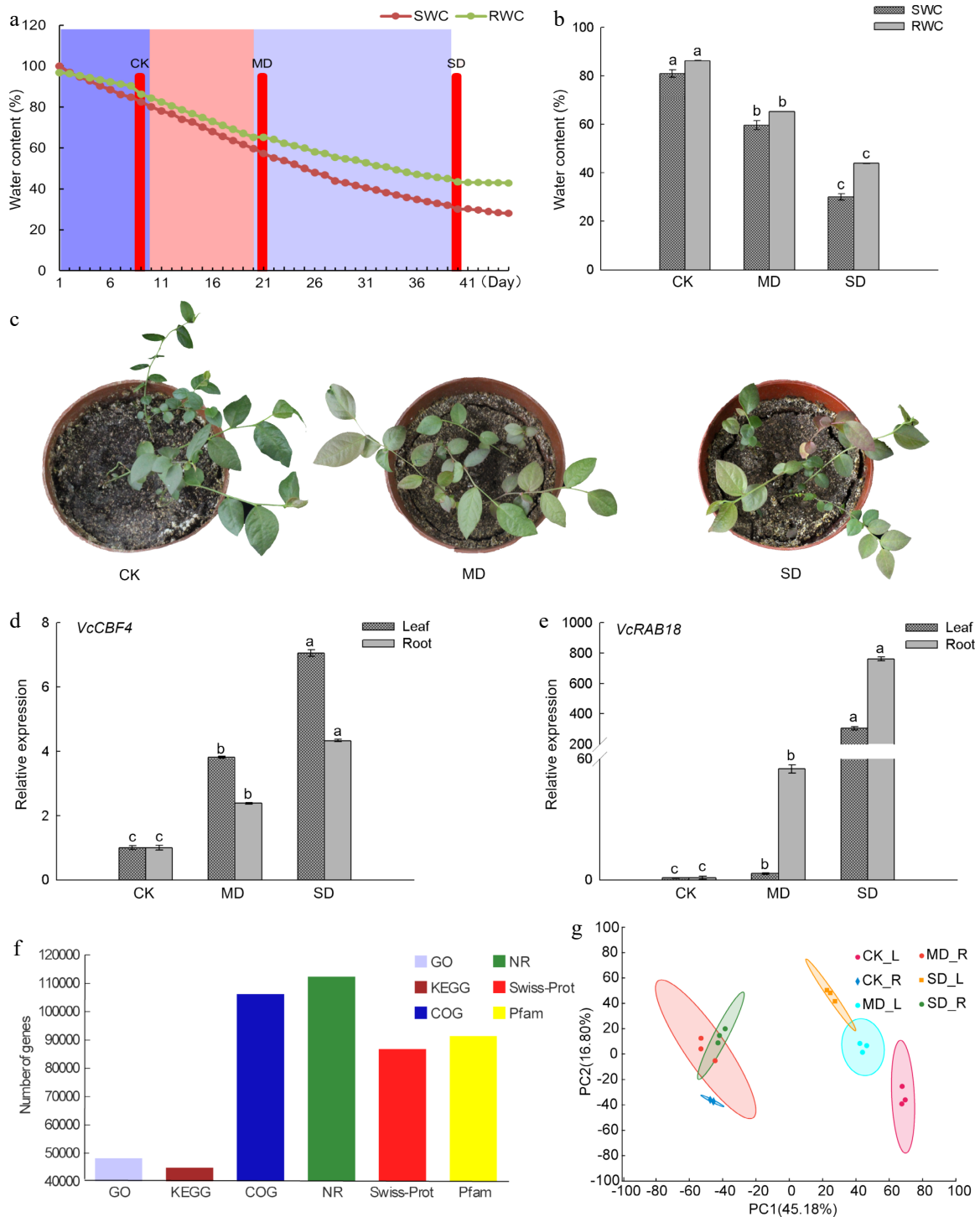
### Analysis of transcriptome sequencing and annotation

In this study, a total of 18 cDNA libraries were constructed, which were derived from different drought treatments of blueberry leaves and roots with three biological replications for each treatment. The transcriptome obtained about 136.53 Gb of clean data and each cDNA library was above 5.74 Gb. The percentage of Q30 bases was above 90.59%, and the average GC content value was 46.20%. The alignment rate ranges from 70.08% to 93.48% by comparing the Clean Data of each library with the designated reference genome (<http://gigadb.org/dataset/100537>) (Supplemental Table S1). A total of 128,559 genes were obtained from this transcriptome. The genes annotated to GO, NR, COG were 48,131, 112,182, 106,043, respectively, and annotated to Pfam, KEGG and Swiss-Prot databases were 91,289, 44,755 and 86,699, respectively. Annotated genes account for 88.16% of the total number of genes (Fig. 1f). Principal Component Analysis (PCA) showed that the similarity among the three replications of each treatment was high, which was 45.18% in PC1 and 16.80% in PC2 (Fig. 1g). The data showed that the obtained sequence was of high-quality and suitable for further bioinformatics analysis.

### Identification of differentially expressed genes

Twenty two highly co-expressed modules were identified based on WGCNA analysis and each module was coded with a unique color (Fig. 2a; Supplemental Fig. S1). Prior to analysis, data should be preprocessed to remove genes with low expression or low coefficient of variation that would affect the accuracy of WGCNA analysis. Before and after preprocessing, the numbers of genes were 128,559 and 47,701, respectively, and the filtered data was used for further analysis. It was found that the first group ('light cyan', 'royal blue', 'red' and 'grey' modules) consisted of 3,921 genes. These eigengenes in the first group were positively or negatively correlated with at least 1 of the 4 samples (MD\_L, SD\_L, MD\_R, and SD\_R), and also showed a significant correlation with phenotypic indicators SWC and RWC. Meanwhile, the second group ('turquoise', 'green', 'green yellow', 'pink' and 'magenta' modules) was found to consist of 16,733 genes. No correlation was found with either the four drought treatments (MD\_L, SD\_L, MD\_R, and SD\_R) nor the phenotypic indicators SWC and RWC with eigengenes in the second group. There were 27,047 genes in the third group (the other 13 colors modules) and these eigengenes were positively or negatively correlated with at least one of the four drought treatments (MD\_L, SD\_L, MD\_R, and SD\_R), but no correlation with the phenotypic indicators SWC and RWC. Compared with the total number of genes after preprocessing, the number of genes in the first, second, and third groups accounted for 8.22%, 35.08%, and 56.70%, respectively. The genes in the first and third groups were combined into a large collection (64.92% of the genes after preprocessed) named "WGCNA\_Drought" (a total of 30,968 genes), which was speculated to be critical genes responding to drought stress.

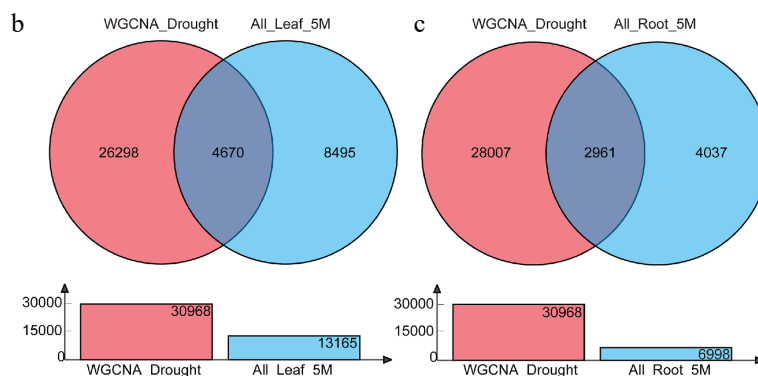
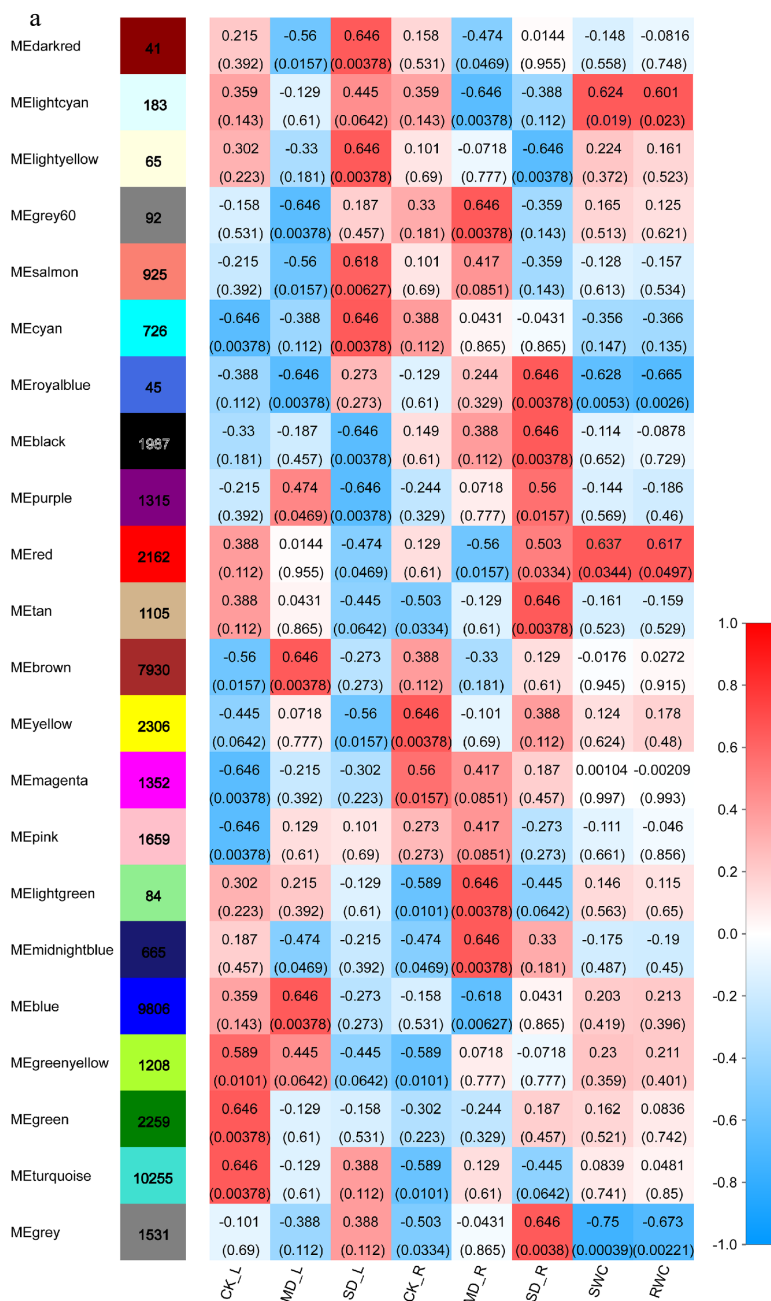
The main cultivated varieties of blueberry are divided into highbush blueberry (*Vaccinium corymbosum*), lowbush blueberry (*Vaccinium angustifolium*) and rabbiteye blueberry (*Vaccinium virgatum*), which belong to tetraploid, tetraploid and hexaploid, respectively<sup>[19,20]</sup>. The highbush blueberry variety 'Bluecrop' in this study was used, and the number of 2-fold



**Fig. 1** Drought treatment and the analysis of gene sequence functional annotation in blueberry. (a) Relative SWC and RWC changes of blueberry, and the determination of three drought stress groups. CK, control group; MD, moderate drought stress group; SD severe drought stress group. (b) Differences of SWC and RWC of the blueberry leaf under drought stress groups. (c) Growth status of blueberry seedlings under three drought stress groups. (d) Expression of *VcCBF4* f blueberry under drought stress. (e) Expression of *VcRAB18* f blueberry under drought stress. (f) Functional annotation analysis of blueberry gene under drought stress. (g) PCA plots of genes identified by RNA-seq of blueberry leaves and roots under drought stress. Each value was represented as the mean value  $\pm$  standard error of three independent determinations. Different letters indicate that Duncan's multiple range test is significantly different at  $P < 0.05$ .

DEGs was excessively discovered in our previous analysis. Therefore, in this study, differentially expressed genes were identified and analyzed by the parameters of  $p$ -adjust and multiple of difference as 0.05 and 5.0, respectively. Three DEGs

collections, in a total of 13,165 DEGs named 'All\_Leaf\_5M' (Supplemental Fig. S2a), were obtained through comparison with the different treatments on leaves. Simultaneously, three DEGs collections were obtained in roots with a total of 6998



**Fig. 2** Weighted gene co-expression network analysis and identification of DEGs in response to drought. (a) Heatmap of correlations (*P*-value in parentheses) of module eigengenes with the drought treatment, soil relative water content, and leaf relative water content. (b) Identification of DEGs in response to drought in leaves (Venn diagram of 'WGCNA\_Drought' and 'All\_Leaf\_5M'). (c) Identification of DEGs in response to drought in roots (Venn diagram of 'WGCNA\_Drought' and 'All\_Root\_5M').



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DEGs named 'All\_Root\_5M' (Supplemental Fig. S2b). Venn analysis was performed on 'WGCNA\_Drought' and 'All\_Leaf/Root\_5M' to obtain 4,670 and 2,961 DEGs which respond to drought in leaf and root, respectively and we named these two sets as 'Leaf\_Drought\_5M' and 'Root\_Drought\_5M' (Fig. 2b, c).

## GO and KEGG analysis of DEGs

The GO analysis showed that 552 GO terms were enriched by 'Leaf\_Drought\_5M', 439 GO terms were enriched by 'Root\_Drought\_5M', and 264 GO terms were simultaneously enriched by the two groups. The similar DEGs which were enriched in both the 'Leaf\_Drought\_5M' and 'Root\_Drought\_5M' groups, and the 10 most highly enriched DEGs in blueberry root and leaf under drought stress with their associated biological processes are shown in Table 1. The associated biological processes included oxidation-reduction process, catabolism, redox controls, stimulus-response, stress response, ion transport, secondary metabolism, and cell wall-related metabolism, etc. It can be seen that the GO terms enriched in leaf DEGs are more than those enriched in roots.

Collectively, the enrichment analysis of GO and KEGG showed that most GO terms and KEGG pathways of the leaves and roots of blueberry in response to drought treatment were common, suggesting the similar cellular biology processes and pathways involved in leaves and roots responding to drought stress (Table 2). However, the leaves and roots also showed certain specific drought-resistant mechanisms due to their own characteristics based on whether GO terms or KEGG pathways were more enriched in leaves than roots.

## Signal transduction-related genes

Significantly enriched signal transduction module in leaves and roots were identified by KEGG pathway enrichment analysis. The top 10 pathways of leaves and roots were obtained from the first KEGG enrichment signal transduction module by secondary KEGG pathway enrichment analysis (Supplemental Table S2). Among them, four pathways including plant hormone signal transduction, MAPK signaling pathway, phosphatidylinositol signaling system and calcium signaling pathway were enriched in both leaves and roots (Fig. 3a, b). In addition,

**Table 1.** GO analysis of blueberry leaf and root DEGs under drought stress.

Accession number	Biological process	Number of enriched genes	
		Leaf_Drought_5M	Root_Drought_5M
GO:005114	Oxidation-reduction process	310	227
GO:0005975	Carbohydrate metabolic process	194	123
GO:0009056	Catabolic process	170	111
GO:0050896	Response to stimulus	170	106
GO:0055085	Transmembrane transport	162	131
GO:0044248	Cellular catabolic process	125	95
GO:0006950	Response to stress	123	73
GO:0006811	Ion transport	122	100
GO:0071554	Cell wall organization or biogenesis	86	28*
GO:0034220	Ion transmembrane transport	84	67
GO:0044550	Secondary metabolic process	73*	54

\* Not included in the 10 GOs with the highest enrichment.

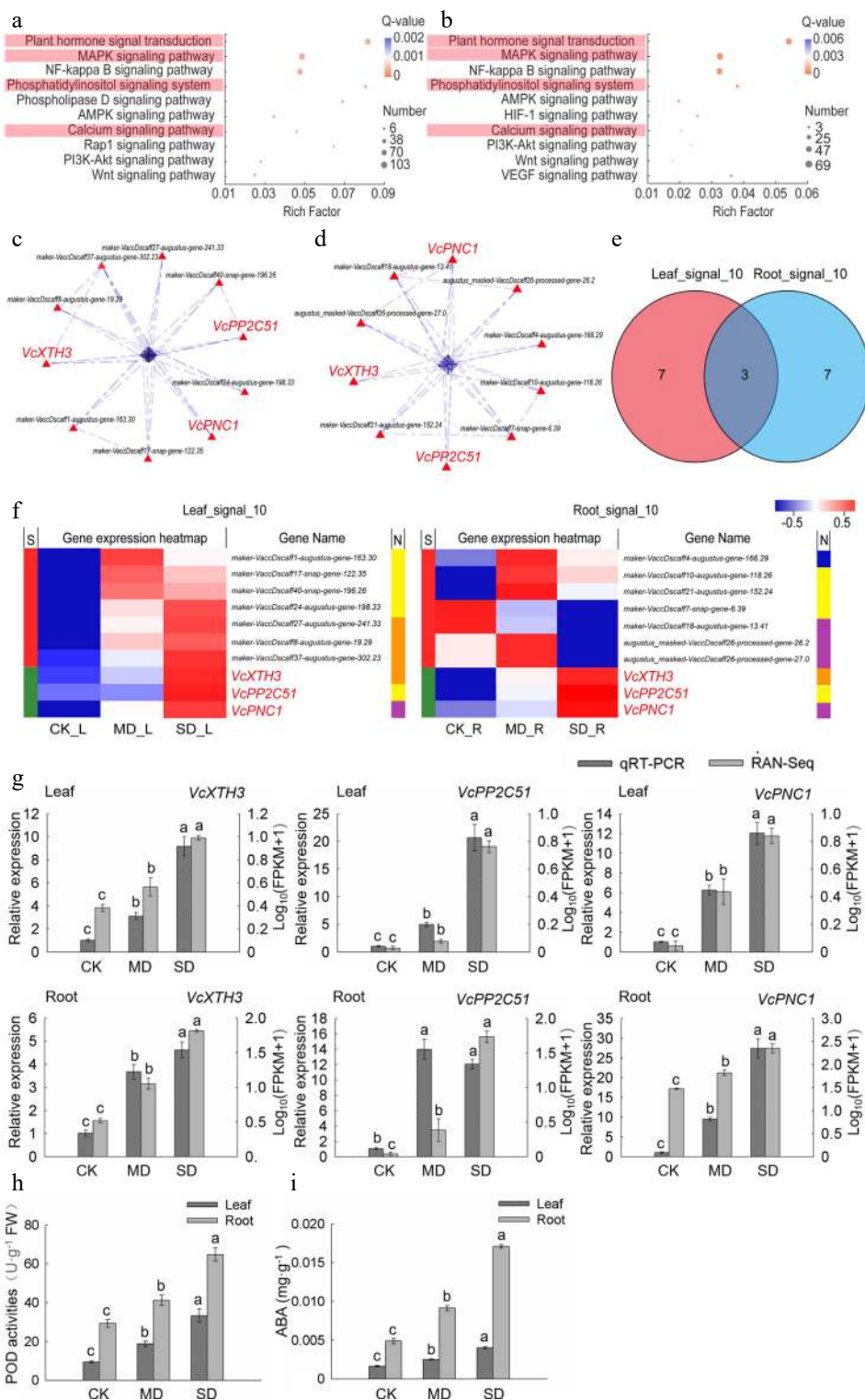
the reactive oxygen species metabolic and biosynthetic process enriched by GO also play a vital role in the signal transduction of abiotic stress. In view of this, the genes of the above five pathways in 'Leaf\_Drought\_5M' and 'Root\_Drought\_5M' were aggregated into two gene sets 'All\_Leaf\_signal' and 'All\_Root\_signal', of which there were 247 and 170 genes, respectively (Supplemental Table S2).

In order to obtain highly correlated genes, we further performed PPI analysis on the two gene sets 'All\_Leaf\_signal' and 'All\_Root\_signal'. The top 10 crucial genes in leaves and roots were obtained and named 'Leaf\_signal\_10' and 'Root\_signal\_10', respectively (Fig. 3c, d). *VcXTH3*, *VcPP2C51*, and *VcPNC1* were common key genes (core enriched genes) in leaves and roots (Fig. 3e, f). The heat map and KEGG annotation analysis of the two gene sets showed that the pathway involving the largest number of genes in 'Leaf\_signal\_10' was plant hormone signal transduction, while the pathways in 'Root\_signal\_10' were MAPK signaling pathway and reactive oxygen species metabolic and biosynthetic process. Among them, *VcXTH3*, *VcPP2C51*, and *VcPNC1* belong to the MAPK signaling pathway, and plant hormone signal transduction,

**Table 2.** KEGG pathway enrichment analysis of blueberry leaf and root DEGs under drought stress.

Pathway	Name	Number of enriched genes	
		Leaf_Drought_5M	Root_Drought_5M
map04010	MAPK signaling pathway	103	69
map04621	NOD-like receptor signaling pathway	102	65
map04075	Plant hormone signal transduction	92	61
map04064	NF-kappa B signaling pathway	88	60
map04626	Plant-pathogen interaction	78	32
map00940	Phenylpropanoid biosynthesis	68	63
map04141	Protein processing in endoplasmic reticulum	67	48
map00010	Glycolysis / Gluconeogenesis	20*	39
map00902	Monoterpenoid biosynthesis	34	26
map00983	Drug metabolism - other enzymes	33	25
map00480	Glutathione metabolism	33	26
map00982	Drug metabolism - cytochrome P450	32	30
map00980	Metabolism of xenobiotics by cytochrome P450	32	30
map00520	Amino sugar and nucleotide sugar metabolism	31	29
map00500	Starch and sucrose metabolism	31	27
map00052	Galactose metabolism	29	26
map00350	Tyrosine metabolism	25	29
map00561	Glycerolipid metabolism	27	15
map00360	Phenylalanine metabolism	25	13*
map00400	Phenylalanine, tyrosine and tryptophan biosynthesis	24	10*
map00941	Flavonoid biosynthesis	23	11*
map00592	alpha-Linolenic acid metabolism	18*	22
map00071	Fatty acid degradation	6*	18

\* Not included in the 20 pathways with highest enrichment.



**Fig. 3** Analysis of the key genes of signal transduction pathway in leaves and roots under drought stress. (a) KEGG enrichment analysis of plant signal transduction-related DEGs in leaves. (b) KEGG enrichment analysis of plant signal transduction-related DEGs in roots. (c) PPI analysis of 'All\_Leaf\_signal'. (d) PPI analysis of 'All\_Root\_signal'. (e) Venn analysis of 'Leaf\_signal\_10' and 'Root\_signal\_10'. (f) Hot map analysis of 'Leaf\_signal\_10' and 'Root\_signal\_10'. S indicates the difference between 'Leaf\_signal\_10' and 'Root\_signal\_10', different genes between the two groups were represented by red color while those being the same are shown in green; function corresponding to each gene in two groups was shown in the N line, purple is reactive oxygen species metabolic and biosynthetic process-related gene, yellow indicates MAPK signaling pathway-related gene, orange is plant hormone signal transduction-related gene, and blue represents calcium signaling pathway-related gene. (g) Relative gene expression (*VcPP2C51*, *VcXTH3*, and *VcPNC1*) in blueberry leaves and roots exposed to drought stress as determined by qRT-PCR with *VcUBC28* as the internal reference gene. (h) POD activities in blueberry leaves and roots under drought stress. (i) ABA content in blueberry leaves and roots under drought stress.

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reactive oxygen species metabolic and biosynthetic process, respectively. Moreover, transcriptome data showed that the expression levels of the above three key genes in leaves and roots under MD and SD treatments were higher than those with CK treatment (Fig. 3f).

qRT-PCR was further performed to validate our RNA-seq results. As shown in Fig. 3g, we found that qRT-PCR data were substantially consistent with the RNA-seq data except *VcPP2C51*. However, it was true that *VcPP2C51* expression showed a similar change trend by using the two methods, suggesting the validity of our transcriptome data. Previous studies and KEGG annotation analysis revealed that the homologous genes of *VcXTH3* encode xyloglucan endotransglucosylase/hydrolase 3, and these genes are associated with changes in ABA levels in plants<sup>[21]</sup>, protein phosphatase 2C encoded by the *VcPP2C51* homologous gene participates in the ABA-activated signaling pathway<sup>[22]</sup>, and POD1 encoded by the *VcPNC1* homologous gene was related to POD activities<sup>[23]</sup>. In order to validate the accuracy of analysis, we measured the POD activities and ABA content in the leaves and roots of blueberry, and the result showed that the activity of POD and ABA content significantly increased ( $P < 0.05$ ) both in leaves and roots with the enhanced degree of drought treatment (Fig. 3h, i).

### Transcription factors involved in blueberry response to drought stress

Transcription factors (TFs) play crucial roles in plant responses to stress such as drought. In this study, we found that there are 367 transcription factors identified from 28 transcription factor families in 'Leaf\_Drought\_5M' (gene set 'All\_Leaf\_TFs'), 185 from 21 transcription factor families in 'Root\_Drought\_5M' (gene set 'All\_Root\_TFs') (Supplemental Table S3).

Through PPI analysis, the top 10 crucial genes in leaves and 10 in roots were obtained and named 'Leaf\_TFs\_10' and 'Root\_TFs\_10', respectively (Fig. 4a, b). Among them, *VcABR1*, *VcABF2*, *VcMYB108*, and *VcMYB93* were common key genes (core enriched genes) in leaves and roots (Fig. 5c, d). The heat map and KEGG annotation analysis of the gene sets 'Leaf\_TFs\_10' and 'Root\_TFs\_10' showed that the transcription factor families involving the largest number of genes in 'Leaf\_TFs\_10' were AP2/ERF family and MYB family, while the transcription factor families in 'Root\_TFs\_10' was the MYB family. *VcMYB108* and *VcMYB93* belong to the MYB family, *VcABR1* and *VcABF2* belong to the AP2/ERF family and bZIP family. Meanwhile, it was also found that the expression levels of these four key genes in leaves and roots under MD and SD treatments were higher than those with CK treatment (Fig. 4d).

The expression level of four key genes were consistent with the trends of RNA-seq results verified by qRT-PCR (Fig. 4e; Supplemental Table S4). Previous studies and KEGG annotation analysis revealed that the ethylene-responsive transcription factor ABR1 and ABA-INSENSITIVE 5-like protein 5 encoded by *ABR1* and *ABF2*, respectively, were involved in the ABA-activated signaling pathway<sup>[24,25]</sup>. The transcription factor MYB108 encoded by homologous gene of *VcMYB108* was involved in the abiotic stress response<sup>[26]</sup>, and the two-component response regulator ORR21 encoded by *VcMYB93* homologous gene was related to ZT biosynthesis<sup>[27,28]</sup>. We further detected ZT content and the results showed that ZT were significantly increased in both leaves and roots under MD and SD

treatments compared with CK ( $P < 0.05$ ) (Fig. 4f). It was noted that ZT content in leaves is higher than in root when plants are subjected to drought stress, which is consistent with the high expression of *VcMYB93* in leaves compared to roots (Fig. 4e, f).

### Metabolism and biosynthesis-related genes

Osmotic adjustment substances are beneficial to plants regulating the water balance and adapting to drought stress. The secondary KEGG pathway enrichment analysis of the first KEGG enrichment metabolic module resulted in the first 20 pathways of leaves and roots (Supplemental Table S5). Ten important drought-responsive pathways were enriched in both leaves and roots, including phenylpropanoid biosynthesis, monoterpenoid biosynthesis, tyrosine metabolism, glutathione metabolism, starch and sucrose metabolism, flavonoid biosynthesis, fatty acid biosynthesis, arginine and proline metabolism, cutin, submarine and wax biosynthesis and alanine, aspartate and glutamate metabolism. (Fig. 5a, b). Since these pathways played essential roles in plants resisting abiotic stress<sup>[29–32]</sup>, genes of the 10 pathways mentioned above in 'Leaf\_Drought\_5M' and 'Root\_Drought\_5M' were further aggregated into two gene sets named as 'All\_Leaf\_MB' and 'All\_Root\_MB', of which there were 243 and 197 genes, respectively (Supplemental Table S5).

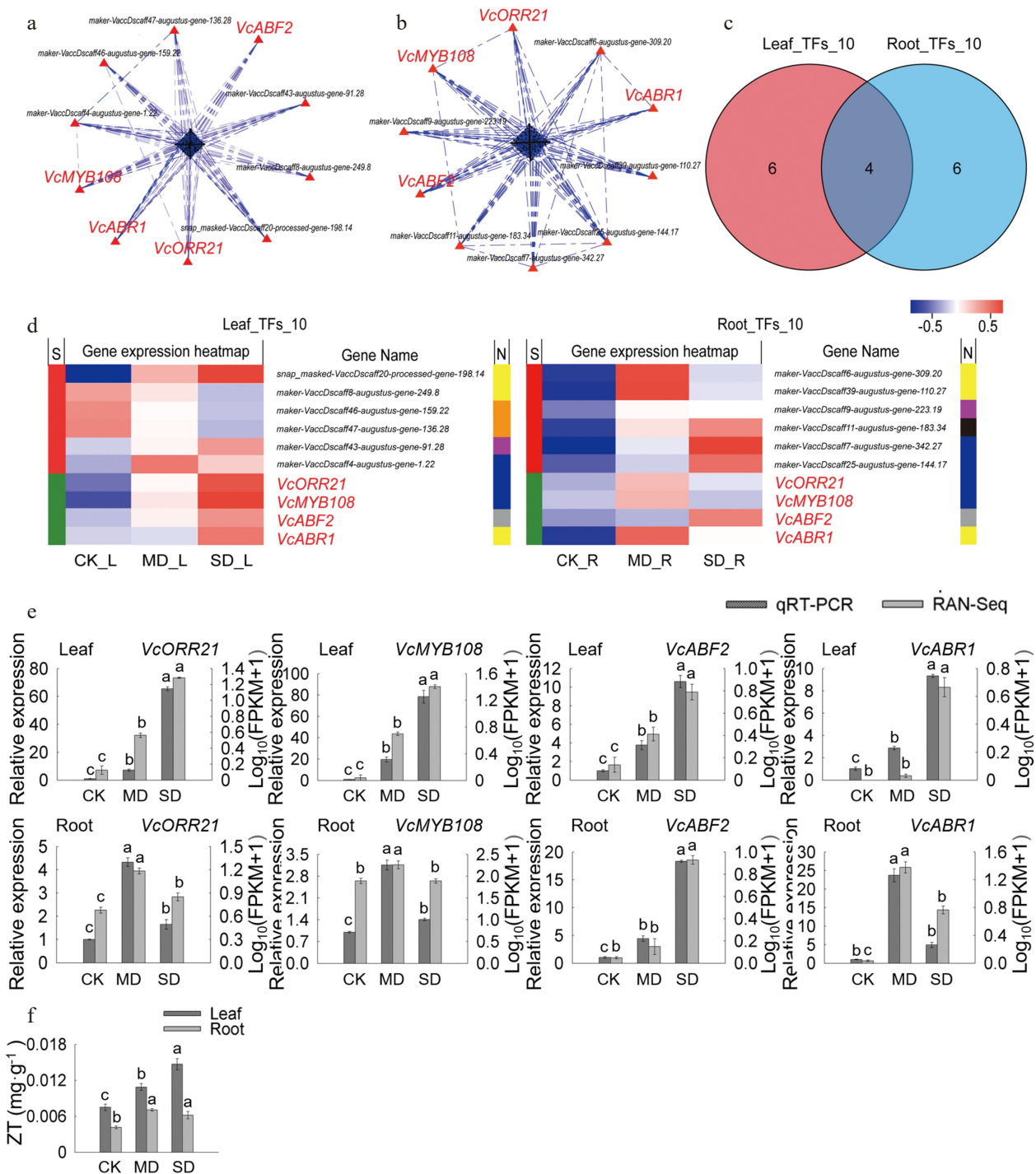
Moreover, 10 crucial genes in leaves and 10 in roots were obtained by PPI analysis, categorized 'Leaf\_MB\_10' and 'Root\_MB\_10', respectively (Fig. 5c, d). *VcCYP75A1* and *VcPNC1* were common key genes (core enriched genes) in leaves and roots (Fig. 5e, f). As mentioned in Fig. 3g, *VcPNC1* was also the key gene in the part of signal transduction-related genes. The heat map and KEGG annotation analysis of the gene sets 'Leaf\_MB\_10' and 'Root\_MB\_10' showed that the pathway involving the largest number of genes in 'Leaf\_MB\_10' was monoterpenoid biosynthesis, while the pathways in 'Root\_MB\_10' were phenylpropanoid biosynthesis and flavonoid biosynthesis. Among them, *VcPNC1* belongs to phenylpropanoid biosynthesis, and *VcCYP75A1* belongs to flavonoid biosynthesis. Meanwhile, it was also found that the expression levels of two key genes in leaves and roots under MD and SD treatments were higher than those of CK (Fig. 5f).

The expression verification of qRT-PCR found that the expression trend of *VcCYP75A1* is consistent with the RNA-seq results (Fig. 5g). Previous studies and KEGG annotation analysis revealed that the flavonoid 3',5'-hydroxylase (F3'5'H) encoded by the *VcCYP75A1* homologous gene is related to the synthesis of anthocyanins<sup>[33,34]</sup>. Therefore, combined with the phenotype of blueberry leaves turning red under drought stress (Fig. 1), the anthocyanin content was determined in this study. The results showed that the anthocyanin concentration in the leaves and roots under MD and SD treatments was significantly higher than those of CK ( $P < 0.05$ ) (Fig. 5h) and more anthocyanin accumulated in leaves especially under SD treatment. Surprisingly, *VcCYP75A1* was induced to highly express in roots under MD. As the drought worsens, the expression level of *VcCYP75A1* declined in roots and greatly increased in leaves under SD treatment (Fig. 5g).

## DISCUSSION

When plants grown under adverse conditions, different signaling pathways and TFs jointly respond to the stress through a variety of complex metabolic responses, including osmotic



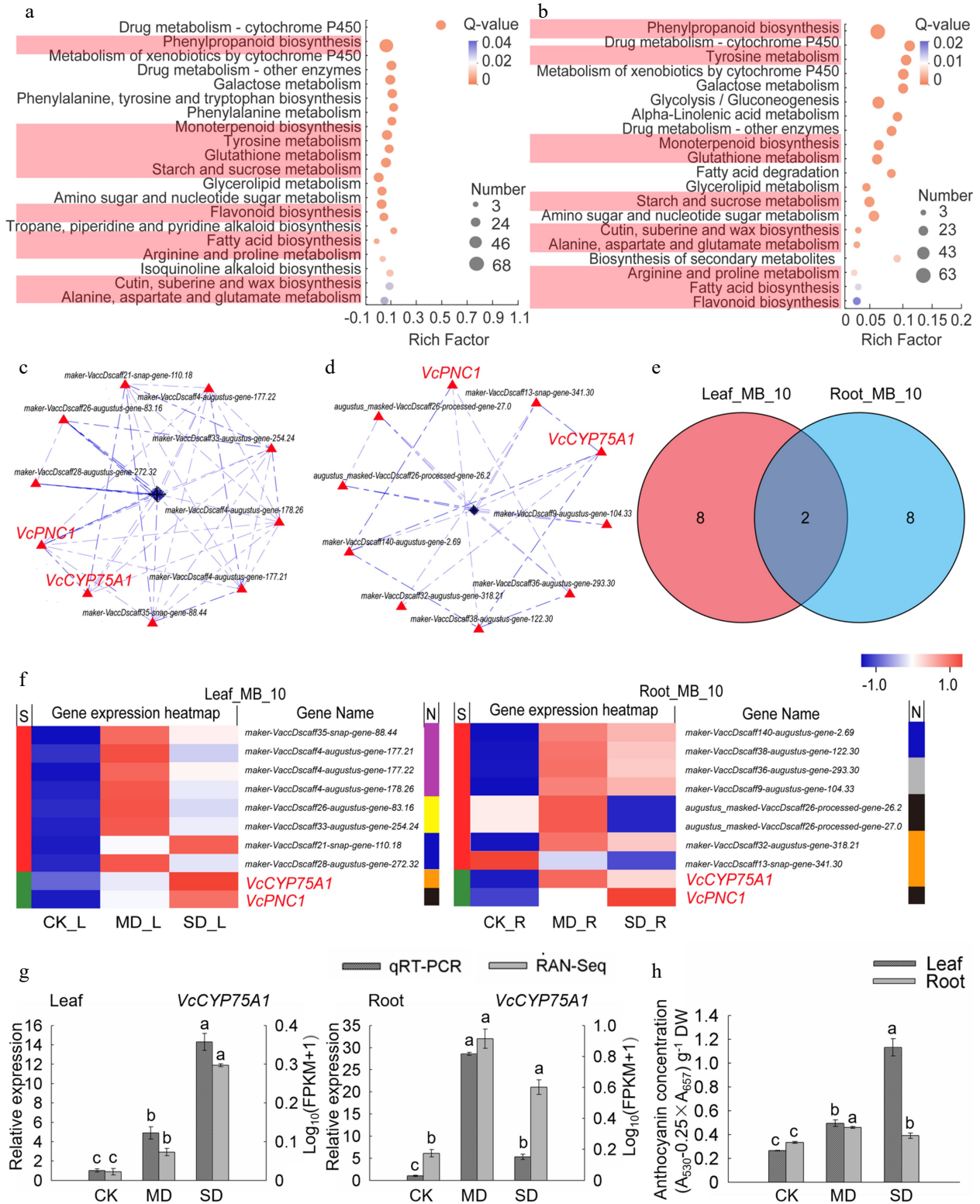


**Fig. 4** Analysis of key TFs in leaves and roots under drought stress. (a) PPI analysis of 'All\_Leaf\_TFs'. (b) PPI analysis of 'All\_Root\_TFs'. (c) Venn analysis of 'Leaf\_TFs\_10' and 'Root\_TFs\_10'. (d) Heat map analysis of 'Leaf\_TFs\_10' and 'Root\_TFs\_10'. S indicates the difference between 'Leaf\_TFs\_10' and 'Root\_TFs\_10', different genes between the two groups were represented by red color while those being that same are shown in green; TFs families corresponding to each gene in two groups was shown in N line, yellow, orange, purple, blue, grey and black indicates AP2/ERF family, bHLH family, WRKY family, MYB family, bZIP family and MYB-related family, respectively. (e) Relative gene expression (*VcABF2*, *VcABR1*, *VcMYB93*, and *VcMYB108*) in blueberry leaves and roots when exposed to drought stress as determined by qRT-PCR with *VcUBC28* as the internal reference gene. (f) ZT content in blueberry leaves and roots under drought stress.

regulation, membrane system regulation, cellular redox, primary metabolism and secondary metabolism<sup>[30,35]</sup>. In our study, the global transcriptome profile of the leaves and roots of blueberry under different drought treatments by RNA-seq were conducted and drought-related genes were screened and

analyzed using WGCNA and KEGG enrichment. The expression of seven identified key genes were verified by qRT-PCR analysis and compared with RNA-seq data, and the results confirm the reliability of our transcriptome data. The leaves and roots of blueberry exhibited different expression patterns under





**Fig. 5** Analysis of key genes of metabolism and biosynthesis in leaves and roots under drought stress. (a) KEGG enrichment analysis of the metabolism and biosynthesis-related DEGs in leaves. (b) KEGG enrichment analysis of the metabolism and biosynthesis-related DEGs in roots. (c) PPI analysis of 'All\_Leaf\_MB'. (d) PPI analysis of 'All\_Root\_MB'. (e) Venn analysis of 'Leaf\_MB\_10' and 'Root\_MB\_10'. (f) Heatmap analysis of 'Leaf\_MB\_10' and 'Root\_MB\_10'. S indicates the difference between 'Leaf\_MB\_10' and 'Root\_MB\_10', Different genes between the two groups were represented by red color while those being the same are shown in green; metabolisms corresponding to each gene in two groups was shown in N line, purple, yellow, blue, brown, black, grey and indigo indicates monoterpenoid biosynthesis, starch and sucrose metabolism, cutin, suberine and wax biosynthesis, flavonoid biosynthesis, phenylpropanoid biosynthesis, fatty acid biosynthesis, and tyrosine metabolism, respectively. (g) Relative gene expression (*VcCYP75A1*) in blueberry leaf and root from plants exposed to drought stress as determined by qRT-PCR with *VcUBC28* as the internal reference gene. (h) Anthocyanin concentration in blueberry under drought stress.

drought treatment and differentially expressed genes (DEGs) was more enriched in leaves with 4670 than in roots with 2961, which is further confirmed by GO terms and KEGG enrichment. Similarly, in *Poncirus trifoliata*, the leaves and roots of tetraploids also exhibited different expression patterns of a variety of upregulated genes with enhanced salt tolerance<sup>[5]</sup>.

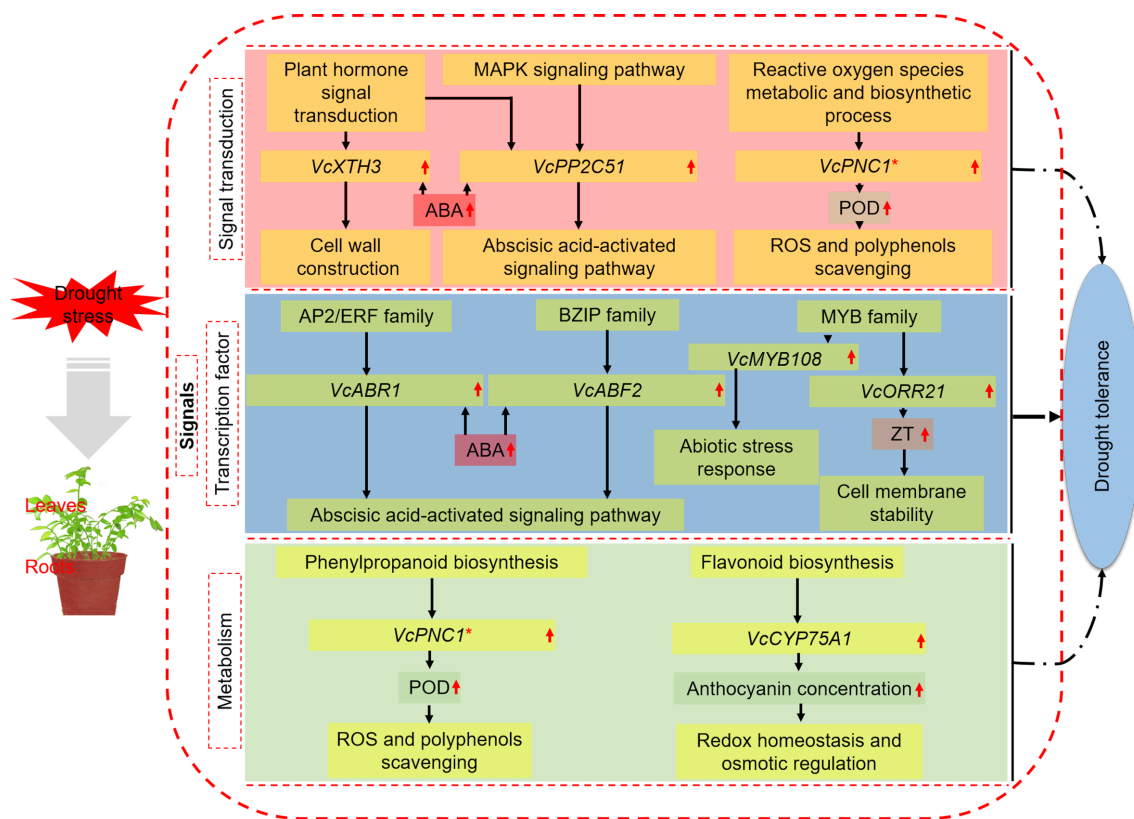
### Multiple signaling pathways involved in blueberry response to drought stress

Under abiotic stress, plants will trigger multiple signal transduction pathways and activate downstream regulatory genes to cope with stress<sup>[30]</sup>. In this study, based on GO and KEGG analysis, we found that multiple signal transduction pathway was involved in blueberry response to drought stress (Figs 4–6). A total of four pathways were enriched in both leaves and roots. The pathway with the highest proportion of core genes in blueberry leaves is plant hormone signal transduction, and in roots are MAPK signaling pathway and reactive oxygen species metabolic and biosynthetic process (Fig. 3). *VcXTH3*, *VcPP2C51*, and *VcPNC1* were identified as common key genes (core enriched genes) in leaves and roots probably involved in blueberries responding to drought stress. Plant MAPK signaling pathway can be initiated by various abiotic stress stimulators and plays a key role in stress signal transduction<sup>[36]</sup>. Nine MAPK genes have been isolated from rice, and the protein kinases they encode can respond to drought stress. The mRNA of *OsMSRMK2* accumulates significantly 15 min after drought stress<sup>[37]</sup>. In this study, 103 in leaves and 69 DEGs in root of MAPK signaling pathway were screened. Among them, five key genes in leaves and four in roots were identified, respectively, of which *VcPP2C51* is the key gene in

both the two tissues. *VcPP2C51* encodes protein phosphatase 2C and participates in MAPK signaling pathway and plant hormone signal transduction. Protein phosphatase 2C is a critical component of ABA signaling pathway. When ABA is present, it promotes the formation of RCAR-PP2C complex, which activates SnRKs and acts on genes such as transcription factors, membrane proteins and ion channels, and finally causes the ABA regulatory pathway to function<sup>[38]</sup>. Here, we found that the expression level of *VcPP2C51* and ABA content under MD and SD treatments were consistent and significantly higher than those of CK (Fig. 3g), suggesting that drought can increase ABA biosynthesis and accumulation both in leaves and roots, induce the expression of *VcPP2C51* and trigger the ABA-activated signaling pathway, thereby promote drought tolerance.

Phytohormone play a key role in response to abiotic stress, effectively coordinating various signal transductions<sup>[39]</sup>. Previous studies have shown that the ABA-activated signaling pathway was the core of plant defense to drought stress<sup>[18]</sup>. In this study, 92 plant hormone signal transduction genes were screened from leaves, including seven key genes, and 61 from roots with two key genes, of which *VcPP2C51* and *VcXTH3* were common key genes. *VcXTH3* encodes xyloglucan endotransglucosylase/hydrolase and participates in cell wall biogenesis, which plays an essential role in cell wall remodeling and cell elongation<sup>[40]</sup>. ABA and drought treatment can regulate the activity of the enzyme, then cause changes of cell permeability to improve plant stress tolerance<sup>[41]</sup>.

Reactive oxygen species (ROS), a typical product of plant cell metabolism, usually accumulates in large amounts when plants



**Fig. 6** A model for mechanisms underlying the enhanced drought tolerance shared by blueberry leaves and roots. \* Important genes also identified in other categories.

## Molecular regulation mechanism of blueberry to drought

are subjected to adversity stress, and causes oxidative damage to cells. ROS can also be used as a signal molecule to activate related active substances or defense systems to alleviate plant damage caused by stress<sup>[42]</sup>. In this study, 30 DEGs for ROS metabolic and biosynthetic processes were screened from leaves with one key gene, and 27 DEGs from roots with four key genes. Among them, *VcPNC1* was identified, and its homologous genes were reported to encode POD and participate in the hydrogen peroxide catabolic process and phenylpropanoid biosynthesis<sup>[23]</sup>. Meanwhile, it was found that three key genes in roots including *VcPER64*, *VcPER5-1* and *VcPER5-2*, and their homologous genes were related to the coding of a critical terminal oxidase POD<sup>[43]</sup>, which were responsible for removing excess H<sub>2</sub>O<sub>2</sub> and phenols in plants<sup>[23]</sup>. In the present study, the expression level of *VcPNC1* and POD activities in leaves and roots both showed a significant upward trend as the degree of drought intensified (Fig. 3). These results suggest that drought stress induce the expression of *VcPNC1* and probably participate in the regulation of POD activities, which is crucial for blueberry to remove ROS and phenols during drought stress.

### Transcription factors involved in response to drought stress

TFs play essential roles in plant growth, development, and stress tolerance<sup>[30]</sup>. Under abiotic stress, TFs reduce the damage caused by stress to plants from multiple levels by initiating multiple pathways<sup>[44]</sup>. TFs families showed different transcriptional regulation modes under drought conditions among plant species with the change of drought intensity, drought time and development stage, etc. WRKY, NAC, MYB, bZIP, Homeobox, and HSF are the main TFs in response to drought in tomato<sup>[45]</sup>. In rice, 261 transcription factors showed differential expression under drought stress and MYB and AP2/EREBP are the most involved families<sup>[46]</sup>. In our study, a total of 367 TFs in leaves involved 28 families, and 185 TFs in roots involved 21 families were screened (Fig. 4). Ten key genes were identified in leaves and roots through PPI analysis, mainly related to AP2/ERF, MYB, and bZIP TFs genes. In fact, similar results have been reported in other species. For instance, AP2/ERF, MYB, and bZIP TFs family genes were identified with the greatest expression variation in drought-tolerant transcriptome analysis of *Populus euphratica*<sup>[47]</sup>. In addition, four key genes including *VcMYB93*, *VcMYB108*, *VcABF2* and *VcABR1* shared by leaves and roots were obtained by Venn analysis combined with the TFs family which the key genes belong to. These results suggest that AP2/ERF, MYB, and bZIP are the key TFs families of blueberry in response to drought stress.

In this study, two key genes, *VcABR1* and *VcABF2*, may be involved in the ABA-activated signaling pathway. Previous studies have shown that the expression of *ABR1* in *Arabidopsis* and *Capsicum* can be induced by ABA and drought<sup>[25]</sup>. ABA-INSENSITIVE 5-like protein (ABF) encoding by *ABF2* participated in the ABA-activated signaling pathway<sup>[48]</sup>. The AREB/ABF-SnRK2 pathway in plants can respond to drought through ABA-mediated osmotic stress. As a binding factor of ABA response elements (ABREs), ABF plays an essential role in resisting drought<sup>[49]</sup>. In this study, the expression levels of *VcABR1* and *VcABF2* under drought stress were significantly higher than CK. In addition, the expression levels of *VcMYB108* in both leaves and roots were markedly induced under MD and SD treatments, suggesting the role of these TFs in blueberry

tolerance to drought. It was reported that *AtMYB93* encodes two-component response regulator ORR21 (ARR-B) and participates in plant hormone signal transduction and ZT biosynthesis<sup>[27,28]</sup>. ZT plays a role in response to drought stress via regulating the stability of plant cell membrane<sup>[50]</sup>. Here, we found that the homologous gene *VcMYB93* of *AtMYB93*, whose expression increases significantly in blueberry leaves as the degree of drought aggravates, first increases and then decreases in root, suggesting that the response time of this gene is different in the roots and leaves. Interestingly, the accumulation of ZT showed the similar trend with *VcMYB93* expression. Based on these results, we speculate that *VcMYB93* is probably involved in ZT biosynthesis or signaling pathway under drought stress.

### Metabolism and biosynthesis-related genes

Osmotic regulatory substances and secondary metabolites play important roles in plant defense. Under drought stress, plant cells rapidly accumulate affinity solutes and osmotic protection substances such as phenols, flavonoids, and fatty acids<sup>[51]</sup>. These substances can coordinate cell osmotic balance by affecting cell water potential, thus protecting cell and membrane homeostasis<sup>[52]</sup>. In this study, multiple pathways in the metabolism category are involved in blueberry drought response. The pathway with the highest proportion of core genes in leaves is monoterpenoid biosynthesis, and in roots are phenylpropanoid biosynthesis and flavonoid biosynthesis. Phenolic compounds are the main products of phenylpropane biosynthesis, playing an important role in abiotic stress<sup>[53]</sup>. Under drought stress, the phenylpropane biosynthesis pathway of *C. korshinskii* and *Triticum* is significantly enriched by GO or KEGG<sup>[31,54]</sup>. Here, we found that 68 DEGs for phenylpropanoid biosynthesis were screened from leaves with one key gene, and 63 DEGs from roots with three key genes. Among them, *VcPNC1* is responsible for reactive oxygen species metabolic and biosynthetic process. All of the key genes of the phenylpropanoid biosynthesis pathway in leaves and roots can be annotated to be related to POD metabolism through KEGG analysis. POD can oxidize phenylpropane phenols, and plays a key role in removing phenols under adversity<sup>[30]</sup>.

Flavonoids, mainly including flavonols and anthocyanins, have antioxidant and reactive oxygen species scavenging properties, which can prevent oxidative damage under abiotic stress<sup>[55]</sup>. Transcriptome analysis of *Brassica juncea* var. *Varuna* and *Magnolia wufengensis* revealed significant changes in genes related to flavonoid biosynthesis under adversity stress<sup>[30,56]</sup>. Flavonoid synthesis genes identified in *Arabidopsis* also play an important role in alleviating oxidation and resisting drought<sup>[57]</sup>. Cytochrome P450 (CYP) superfamily is the largest plant enzyme family in plant metabolism<sup>[58]</sup>. CYP plays a role in plant development and defense responses mainly by participating in the biosynthesis of phytoalexins, the synthesis of secondary metabolites and the regulation of phytohormone metabolism<sup>[59]</sup>. In our study, 23 DEGs related to flavonoid synthesis in leaves with one key gene and 11 in roots with three key genes were screened, respectively. Among them, *VcCYP75A1* is a common key gene, which encodes flavonoid 3',5'-hydroxylase (F3'5'H) and its homologues were involved in drought stress response through redox homeostasis and osmotic adjustment<sup>[60,61]</sup>. F3'5'H is a key enzyme in the synthesis of dihydroquercetin in flavonoid biosynthesis, which is a key



process for the synthesis of anthocyanins<sup>[33]</sup>. *VcCYP75A1* was induced to highly express in roots under MD. As drought intensified, the expression level of *VcCYP75A1* declined in roots and greatly increased in leaves under SD treatment (Fig. 5g). The anthocyanin content showed a similar trend as the change in expression level of *VcCYP75A1* (Fig. 5h). In comparison, the anthocyanin content in the roots is relatively lower than in the leaves under SD treatments. Given the correlation between anthocyanin synthesis and the expression level of *VcCYP75A1* in the leaves and roots of blueberry under drought stress, we speculate that *VcCYP75A1* is likely involved in blueberry flavonoid synthesis that modulates the anthocyanin synthesis and regulation in response to drought stress, being highly expressed in the roots early, and in the leaves late.

### The molecular regulation mechanism and network of blueberry to drought

In this study, the global transcription profiles of blueberry leaves and roots were analyzed using WGCNA and PPI analysis. The change trend of key genes was verified by qRT-PCR and consistent with the corresponding physiological indexes under drought stress. Eight key genes shared by leaves and roots were screened, including three signal transduction related genes named *VcXTH3*, *VcPP2C51* and *VcPNC1*, four transcription factor-related genes named *VcABR1*, *VcABF2*, *VcMYB108* and *VcORR21*, two metabolism and biosynthesis-related genes named *VcPNC1* and *VcCYP75A1*. In the meantime, the key genes of leaves and roots were screened, and there were seven each in leaves and roots in the signal transduction response, six each in leaves and roots in the transcription factor response, and eight each in the two tissues in the metabolism and biosynthesis responses (Supplemental Table S6). These genes are also essential for understanding the mechanism of blueberries in response to drought stress, and it is worthy of further investigation.

Taken together, we proposed a potential working model to explore the mechanisms of blueberry in response to drought (Fig. 6). Under drought stress, the responsive pathways of leaves and roots of blueberry involved signal transduction, regulation of transcription factors, and metabolic response. The leaves and roots have their specific drought-resistant mechanisms due to their own characteristics since DEGs and GO terms or KEGG pathways were more enriched in leaves than those in roots under drought stress. *VcXTH3* in the plant hormone signal transduction pathway may induce cell wall remodeling and cell elongation through the regulation of ABA. *VcPP2C51* was annotated into both MAPK signaling pathway and ABA-activated signaling pathway, suggesting the two pathways may crosstalk at this gene site. *VcPNC1* in ROS metabolic and biosynthetic process pathway is a POD regulatory gene and responsible for removing excess  $H_2O_2$  and phenols in plants. *VcABR1* of AP2/ERF family and *VcABF2* of bZIP family in the regulation category of transcription factors are both key genes of the ABA-activated signaling pathway to resist drought stress. *VcMYB108* in MYB family also likely participate in the abiotic stress response, but the specific mechanism of resisting drought stress needs further study. *VcMYB93*, another member of the MYB family, was annotated into ZT biosynthesis and function probably by improving cell membrane stability. *VcCYP75A1* of the flavonoid biosynthesis pathway in the metabolism category can promote anthocyanin accumulation and resist drought by affecting cell redox homeostasis and osmotic regulation.

Among them, *VcPNC1* was a potential key gene in the two pathways of ROS and phenylpropanoid biosynthesis, indicating that it plays an essential role in blueberry response to drought stress. However, these potential regulation pathways and key genes needs further investigation.

## MATERIALS AND METHODS

### Plant materials and drought treatments

In this study, the plants of blueberry variety 'Bluecrop' were used as experimental materials. The 3-month-old uniform seedlings with a height of about 18 cm were cultivated and transplanted into the soil for drought treatment. The soil constitution, available nutrients, and cultivation environment were performed as described in a previous study<sup>[62]</sup>. Plants with the same growth conditions were randomly selected for grouping, and each treatment group had three replicates, each replicate included nine pots with three plants in each pot. A total of three groups were set up in the following experiment: control group (CK), moderate drought (MD) and severe drought (SD) with the soil water contents (SWC) designated at 75%–80%, 55%–60% and 30%–35%, respectively. All pots were watered every 3 d with an equal amount of water. After all the seedlings were cultivated for 15 d, the soil water content of the control group and the experimental group was maintained at the predetermined soil water content by withholding irrigation. The SWC of the three groups reached the predetermined level after 10, 20 and 40 d of withholding irrigation<sup>[62,63]</sup>. The SWCs of the three groups were controlled by the gravimetric method<sup>[64]</sup>. Samples for RNA transcriptome sequencing were collected when soil water content in each of the three groups reached predetermined levels. The plants used for the physiological indexes need to maintain the corresponding SWC for 10 d after the SWC of the three groups reaches the predetermined level.

The leaves (L) and roots (R) of blueberry seedlings were taken, respectively, rinsed with distilled water and dried, immediately placed in liquid nitrogen for quick freezing, and then stored at  $-80^{\circ}C$ . For RNA-seq and qRT-PCR experiments, each treatment included three biological replicates, each biological replicate included one seedling. For physiological and biochemical analysis, six plants were randomly selected as a biological replicate, and each group was set up with three biological replicates.

### Measurement of morphological and physiological indexes

The Peroxidase (POD) activity was detected using a kit from Jiancheng Bioengineering Institute (Nanjing, China). The concentration of anthocyanin was quantified by  $(A_{530} - 0.25 \times A_{657}) g^{-1}$  dry weight (DW) using a recorded absorbance method with modification. The endogenous phytohormones ZT and ABA were measured by high-performance liquid chromatography (HPLC). The detection wavelength was 254 nm of ABA and 270 nm of ZT, with an injection volume of 10  $\mu L$ . The specific methods, experimental operations, and other settings were performed as described in previous studies<sup>[63]</sup>. All experiments were performed for three technical replicates and three biological replicates.

### RNA sequencing and transcriptome analysis

The library construction and sequencing (Illumina HiSeqxten system) of the samples of the three treatments were conducted



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by Shanghai Majorbio Bio-pharm Biotechnology Co., Ltd. (Shanghai, China)<sup>[62]</sup>. The total RNA isolation, construction of RNA-seq transcriptome library, trim and quality control of raw reads, and other settings were performed as described in our previous studies<sup>[62]</sup>. The clean reads of our obtained were individually aligned with the reference genome (<http://gigadb.org/dataset/100537>) using Hisat2 software (version2.0.0) with default parameters.

The comparison of genes and database are as follows: using software DIAMOND, NR and Swiss-Prot compared to EggNOG database, and BLAST2GO, HMMER and KOBAS2.1<sup>[65]</sup> was compared to GO, Pfam and KEGG database, respectively. All the above transcriptome data analysis and the sample PCA analysis were performed on the Majorbio online cloud platform with default parameters (<https://cloud.majorbio.com/>).

### Differential expression analysis, functional enrichment and data analysis

RSEM was used to quantify gene and isoform abundances (<http://deweylab.biostat.wisc.edu/rsem/>)<sup>[66]</sup>, and the DESeq2 (a R statistical package software) was used for the differential expression analysis (<http://bioconductor.org/packages/stats/bioc/DESeq2/>)<sup>[67]</sup>. The DEGs between two different samples were identified by expression level, and the expression level of each gene was calculated according to FPKM. Genes with  $P$ -adjust < 0.05 and fold change  $\geq 5$  were defined as DEGs. Venn analysis of DEGs were performed at 'Majorbio' Cloud Platform. Functional-enrichment analysis including KEGG and GO was performed on DEGs to identify which DEGs significantly enriched in metabolic pathways and GO terms in the background of Bonferroni-corrected  $P$ -value  $\leq 0.05$  whole-transcriptome. Heatmaps were generated using the  $\log_{10}$  fold changes values at MD\_R/SD\_R/MD\_L/SD\_L compared with CK\_R and CK\_L. WGCNA was constructed using the online tools<sup>[68]</sup> on the Majorbio Cloud Platform. Module recognition (network Type = signed, soft power = 6, minimum module size = 30, minKME to Stay = 0.3, mergeCutHeight = 0.25), and genomes with similar expression patterns ('modules') were identified. The module eigengenes (i.e., the first principal component of the module) were associated with the related variables of the main drought stress treatment (as dummy variable) using linear regression<sup>[69]</sup>. Drought data included SWC and RWC. Finally, the gene PPI was constructed by the 'Majorbio' Cloud Platform<sup>[63]</sup>. All analysis settings were set at their default values unless previously mentioned.

### Quantitative real-time PCR

Total RNA extraction was conducted from leaves and roots according to TRIzol® Reagent Plant RNA Kit (Invitrogen). The first-strand cDNA was synthesized according to FastQuant cDNA First-Strand Synthesis Kit (Tiangen Biotechnology, Beijing). The instruments and reagents used in the qRT-PCR assay were StepOnePlus™ (ABI, USA) and real-time PCR kit (Tiangen Biotechnology, Beijing), respectively. The primer sequences of eight DEGs and other genes used in this study are shown in [Supplemental Table S4](#). Expression data were analyzed using VcUBC28 as the reference gene<sup>[62,70]</sup>. The RNA-seq data were displayed by  $\log_{10}$  (FPKM + 1). In qRT-PCR experiments, all samples were conducted in three replicates.

### Statistical analyses of data

The IBM-SPSS Statistics v23 was used for statistical analysis.

Statistical differences were analyzed using Dunnett's test, and  $P < 0.05$  was considered a significant difference.

### Data availability

All data and materials used in this study are publicly available. Illumina sequencing raw data was uploaded to the NCBI repository ([www.ncbi.nlm.nih.gov/bioproject/PRJNA737006/](http://www.ncbi.nlm.nih.gov/bioproject/PRJNA737006/)) with Bio project number PRJNA737006. The other datasets supporting the conclusions of this article are included within the article (see Supplementary Information section).

### Ethical statement

This article does not contain any studies with human participants or animals performed by any of the authors.

### CONCLUSIONS

In this study, the transcriptome profile of blueberry under different degrees of drought stress were conducted, the key genes and pathways associated with drought tolerance were screened by WGCNA and Venn analysis. Eight key pathways and eight DEGs (VcXTH3, VcPP2C51, VcPNC1, VcCYP75A1, VcABR1, VcABF2, VcMYB108 and VcMYB93) were shared both in leaves and roots were identified though GO terms and KEGG pathways analysis. The pathway with the most core genes in leaves is the plant hormone signal transduction pathway, and in roots are the MAPK signaling pathway and reactive oxygen species metabolism. In conclusion, our study revealed the synergistic and distinct defense pathways and mechanisms in leaves and roots of blueberry and explored the potential regulatory network in blueberry response to drought stress.

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### Conflict of interest

The authors declare that they have no conflict of interest.

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### REFERENCES

- Plunkett BJ, Easley RV, Dare AP, Warren BAW, Grierson ERP, et al. 2018. MYBA from blueberry (*Vaccinium* section *Cyanococcus*) is a subgroup 6 type R2R3MYB transcription factor that activates anthocyanin production. *Frontiers in Plant Science* 9:1300
- Pérez-Pastor A, Ruiz-Sánchez MC, Conesa MR. 2016. Drought stress effect on woody tree yield. In *Water Stress and Crop Plants: A Sustainable Approach*, ed. Ahmad P. UK: John Wiley & Sons. pp. 356–74. <https://doi.org/10.1002/9781119054450.ch22>

3. Chen X, Qiu L, Guo H, Wang Y, Yuan H, et al. 2017. Spermidine induces physiological and biochemical changes in southern highbush blueberry under drought stress. *Brazilian Journal of Botany* 40:841–51
4. Drobek M, Frąc M, Cybulska J. 2019. Plant biostimulants: importance of the quality and yield of horticultural crops and the improvement of plant tolerance to abiotic stress—A review. *Agronomy* 9:335
5. Wei T, Wang Y, Liu JH. 2020. Comparative transcriptome analysis reveals synergistic and disparate defense pathways in the leaves and roots of trifoliolate orange (*Poncirus trifoliata*) autotetraploids with enhanced salt tolerance. *Horticulture Research* 7:88
6. Osakabe Y, Osakabe K, Shinozaki K, Tran LSP. 2014. Response of plants to water stress. *Frontiers in Plant Science* 5:86
7. Gonçalves LP, Boscaroli Camargo RL, Takita MA, Machado MA, Dos Soares Filho WS, et al. 2019. Rootstock-induced molecular responses associated with drought tolerance in sweet orange as revealed by RNA-Seq. *BMC Genomics* 20:110
8. Katiyar A, Smita S, Lenka SK, Rajwanshi R, Chinnusamy V, et al. 2012. Genome-wide classification and expression analysis of MYB transcription factor families in rice and *Arabidopsis*. *BMC Genomics* 13:544
9. Yuan C, Li C, Lu X, Zhao X, Yan C, et al. 2020. Comprehensive genomic characterization of NAC transcription factor family and their response to salt and drought stress in peanut. *BMC Plant Biology* 20:454
10. Baldoni E, Genga A, Cominelli E. 2015. Plant MYB transcription factors: their role in drought response mechanisms. *International Journal of Molecular Sciences* 16:15811–51
11. Lee SB, Suh MC. 2015. Cuticular wax biosynthesis is up-regulated by the MYB94 transcription factor in *Arabidopsis*. *Plant and Cell Physiology* 56:48–60
12. Vaziriyeganeh M, Khan S, Zwiazek JJ. 2021. Transcriptome and metabolome analyses reveal potential salt tolerance mechanisms contributing to maintenance of water balance by the halophytic grass *Puccinellia nuttalliana*. *Frontiers in Plant Science* 12:760863
13. Kim S, Kang JY, Cho DI, Park JH, Kim SY. 2004. ABF2, an ABRE-binding bZIP factor, is an essential component of glucose signaling and its overexpression affects multiple stress tolerance. *The Plant Journal* 40:75–87
14. Wu L, Ma L, Li L, Li Y. 2016. Studies on morphological and physiological response of eight blueberry cultivars underwater stress. *Acta Horticulturae* 1117:251–58
15. Yan Y, Castellarin SD. 2022. Blueberry water loss is related to both cuticular wax composition and stem scar size. *Postharvest Biology and Technology* 188:111907
16. Xiao H, Tattersall EAR, Siddiqua MK, Cramer GR, Nassuth A. 2008. CBF4 is a unique member of the CBF transcription factor family of *Vitis vinifera* and *Vitis riparia*. *Plant, Cell & Environment* 31:1–10
17. Haake V, Cook D, Riechmann J, Pineda O, Thomashow MF, et al. 2002. Transcription factor CBF4 is a regulator of drought adaptation in *Arabidopsis*. *Plant Physiology* 130:639–48
18. Zhu J. 2016. Abiotic stress signaling and responses in plants. *Cell* 167:313–24
19. Colle M, Leisner CP, Wai CM, Ou S, Bird KA, et al. 2019. Haplotype-phased genome and evolution of phytonutrient pathways of tetraploid blueberry. *GigaScience* 8:giz012
20. Yu J, Hulse-Kemp AM, Babiker E, Staton M. 2021. High-quality reference genome and annotation aids understanding of berry development for evergreen blueberry (*Vaccinium darrowii*). *Horticulture Research* 8:228
21. He H, Serraj R, Yang Q. 2009. Changes in *OsXTH* gene expression, ABA content, and peduncle elongation in rice subjected to drought at the reproductive stage. *Acta Physiologiae Plantarum* 31:749–56
22. Dupeux F, Antoni R, Betz K, Santiago J, Gonzalez-Guzman M, et al. 2011. Modulation of abscisic acid signaling in vivo by an engineered receptor-insensitive protein phosphatase type 2C allele. *Plant Physiology* 156:106–16
23. Mei W, Qin Y, Song W, Li J, Zhu Y. 2009. Cotton *GhPOX1* encoding plant class III peroxidase may be responsible for the high level of reactive oxygen species production that is related to cotton fiber elongation. *Journal of Genetics and Genomics* 36:141–50
24. Amir Hossain M, Lee Y, Cho JI, Ahn CH, Lee SK, et al. 2010. The bZIP transcription factor *OsABF1* is an ABA responsive element binding factor that enhances abiotic stress signaling in rice. *Plant Molecular Biology* 72:557–66
25. Pandey GK, Grant JJ, Cheong YH, Kim BG, Li L, et al. 2005. *ABR1*, an APETALA2-domain transcription factor that functions as a repressor of ABA response in *Arabidopsis*. *Plant Physiology* 139:1185–93
26. Mengiste T, Chen X, Salmeron J, Dietrich R. 2003. The *BOTRYTIS SUSCEPTIBLE1* gene encodes an R2R3MYB transcription factor protein that is required for biotic and abiotic stress responses in *Arabidopsis*. *The Plant Cell* 15:2551–65
27. To JPC, Haberer G, Ferreira FJ, Deruère J, Mason MG, et al. 2004. Type-A arabidopsis response regulators are partially redundant negative regulators of cytokinin signaling. *The Plant Cell* 16:658–71
28. Mason MG, Mathews DE, Argyros DA, Maxwell BB, Kieber JJ, et al. 2005. Multiple type-B response regulators mediate cytokinin signal transduction in *Arabidopsis*. *The Plant Cell* 17:3007–18
29. Chen J, Song Y, Zhang H, Zhang D. 2013. Genome-wide analysis of gene expression in response to drought stress in *Populus simonii*. *Plant Molecular Biology Reporter* 31:946–62
30. Deng S, Ma J, Zhang L, Chen F, Sang Z, et al. 2019. De novo transcriptome sequencing and gene expression profiling of *Magnolia wufengensis* in response to cold stress. *BMC Plant Biology* 19:321
31. Liu F, Xie L, Yao Z, Zhou Y, Zhou W, et al. 2019. *Caragana korshinskii* phenylalanine ammonialyase is up-regulated in the phenylpropanoid biosynthesis pathway in response to drought stress. *Biotechnology & Biotechnological Equipment* 33:842–54
32. Shamala LF, Zhou HC, Han ZX, Wei S. 2020. UV-B induces distinct transcriptional re-programing in UVR8-signal transduction, flavonoid, and terpenoids pathways in *Camellia sinensis*. *Frontiers in Plant Science* 11:234
33. Jung CS, Griffiths HM, de Jong DM, Cheng S, Bodis M, et al. 2005. The potato *P* locus codes for flavonoid 3',5'-hydroxylase. *Theoretical and Applied Genetics* 110:269–75
34. Ishiguro K, Taniguchi M, Tanaka Y. 2012. Functional analysis of *Antirrhinum kelloogii* flavonoid 3'-hydroxylase and flavonoid 3',5'-hydroxylase genes; critical role in flower color and evolution in the genus *Antirrhinum*. *Journal of Plant Research* 125:451–56
35. Bhargava S, Sawant K, Tuberosa R. 2013. Drought stress adaptation: metabolic adjustment and regulation of gene expression. *Plant Breeding* 132:21–32
36. Krysan PJ, Jester PJ, Gottwald JR, Sussman MR. 2002. An *Arabidopsis* mitogen-activated protein kinase kinase gene family encodes essential positive regulators of cytokinesis. *The Plant Cell* 14:1109–20
37. Agrawal GK, Rakwal R, Iwahashi H. 2002. Isolation of novel rice (*Oryza sativa* L.) multiple stress responsive MAP kinase gene, *OsMSRMK2*, whose mRNA accumulates rapidly in response to environmental cues. *Biochemical and Biophysical Research Communications* 294:1009–16
38. Ma Y, Szostkiewicz I, Korte A, Moes D, Yang Y, et al. 2009. Regulators of PP2C phosphatase activity function as abscisic acid sensors. *Science* 324:1064–68
39. Peleg Z, Blumwald E. 2011. Hormone balance and abiotic stress tolerance in crop plants. *Current Opinion in Plant Biology* 14:290–95
40. Cho SK, Kim JE, Park JA, Eom TJ, Kim WT. 2006. Constitutive expression of abiotic stress-inducible hot pepper *CaXTH3*, which encodes a xyloglucan endotransglucosylase/hydrolase homolog, improves drought and salt tolerance in transgenic *Arabidopsis* plants. *FEBS Letters* 580:3136–44

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41. Choi JY, Seo YS, Kim SJ, Kim WT, Shin JS. 2011. Constitutive expression of *CaXTH3*, a hot pepper xyloglucan endotransglucosylase/hydrolase, enhanced tolerance to salt and drought stresses without phenotypic defects in tomato plants (*Solanum lycopersicum* cv. Dotaerang). *Plant Cell Reports* 30:867–77
42. Jaspers P, Kangasjärvi J. 2010. Reactive oxygen species in abiotic stress signaling. *Physiologia Plantarum* 138:405–13
43. Kawano T. 2003. Roles of the reactive oxygen species-generating peroxidase reactions in plant defense and growth induction. *Plant Cell Reports* 21:829–37
44. Shinozaki K, Yamaguchi-Shinozaki K. 2007. Gene networks involved in drought stress response and tolerance. *Journal of Experimental Botany* 58:221–27
45. Gong P, Zhang J, Li H, Yang C, Zhang C, et al. 2010. Transcriptional profiles of drought-responsive genes in modulating transcription signal transduction, and biochemical pathways in tomato. *Journal of Experimental Botany* 61:3563–75
46. Degenkolbe T, Do PT, Zuther E, Repsilber D, Walther D, et al. 2009. Expression profiling of rice cultivars differing in their tolerance to long-term drought stress. *Plant Molecular Biology* 69:133–53
47. Yan DH, Fenning T, Tang S, Xia X, Yin W. 2012. Genome-wide transcriptional response of *Populus euphratica* to long-term drought stress. *Plant Science* 195:24–35
48. Hong E, Lim CW, Han SW, Lee SC. 2017. Functional analysis of the pepper ethylene-responsive transcription factor, *CaAIEF1*, in enhanced ABA sensitivity and drought tolerance. *Frontiers in Plant Science* 8:1407
49. Fujita Y, Yoshida T, Yamaguchi-Shinozaki K. 2013. Pivotal role of the AREB/ABF-SnRK2 pathway in ABRE-mediated transcription in response to osmotic stress in plants. *Physiologia Plantarum* 147:15–27
50. Wei D, Li J, Zhang R, Ning S. 2002. Effects of ABA and ZT on some physiological characteristics of cell membrane in wheat leaf. *Acta Botanica Boreali-occidentalia Sinica* 22:1360–64
51. Gu H, Wang Y, Xie H, Qiu C, Zhang S, et al. 2020. Drought stress triggers proteomic changes involving lignin, flavonoids and fatty acids in tea plants. *Scientific Reports* 10:15504
52. Khan MS, Ahmad D, Khan MA. 2015. Utilization of genes encoding osmoprotectants in transgenic plants for enhanced abiotic stress tolerance. *Electronic Journal of Biotechnology* 18:257–66
53. Christie PJ, Alfenito MR, Walbot V. 1994. Impact of low-temperature stress on general phenylpropanoid and anthocyanin pathways: enhancement of transcript abundance and anthocyanin pigmentation in maize seedlings. *Planta* 194:541–49
54. Monika D, Sarika S, Sneha T, R. RA, Kishor G. 2018. Transcriptome analysis reveals interplay between hormones, ROS metabolism and cell wall biosynthesis for drought-induced root growth in wheat. *Plant Physiology and Biochemistry* 130:482–92
55. Nakabayashi R, Yonekura-Sakakibara K, Urano K, Suzuki M, Yamada Y, et al. 2014. Enhancement of oxidative and drought tolerance in *Arabidopsis* by overaccumulation of antioxidant flavonoids. *Plant Journal* 77:367–79
56. Bhardwaj AR, Joshi G, Kukreja B, Malik V, Arora P, et al. 2015. Global insights into high temperature and drought stress regulated genes by RNA-Seq in economically important oilseed crop *Brassica juncea*. *BMC Plant Biology* 15:9
57. Dixon RA, Paiva NL. 1995. Stress-induced phenylpropanoid metabolism. *The Plant Cell* 7:1085–97
58. Nelson D, Werck-Reichhart D. 2011. A P450-centric view of plant evolution. *The Plant Journal* 66:194–211
59. Pandian BA, Sathishraj R, Djanaguiraman M, Prasad PVV, Jugulam M. 2020. Role of cytochrome P450 enzymes in plant stress response. *Antioxidants* 9:454
60. Nakabayashi R, Mori T, Saito K. 2014. Alternation of flavonoid accumulation under drought stress in *Arabidopsis thaliana*. *Plant Signaling & Behavior* 9:e29518
61. Liu S, Ju J, Xia G. 2014. Identification of the flavonoid 3'-hydroxylase and flavonoid 3',5'-hydroxylase genes from *Antarctic moss* and their regulation during abiotic stress. *Gene* 543:145–52
62. Wang A, Liang K, Yang S, Cao Y, Wang L, et al. 2021. Genome-wide analysis of MYB transcription factors of *Vaccinium corymbosum* and their positive responses to drought stress. *BMC Genomics* 22:565
63. Liang K, Wang A, Sun Y, Yu M, Zhang L. 2019. Identification and expression of NAC transcription factors of *Vaccinium corymbosum* L. in response to drought stress. *Forests* 10:1088
64. Luo YZ, Liu H, Yan G, Li G, Turner NC. 2019. Roots of lucerne seedlings are more resilient to a water deficit than leaves or stems. *Agronomy* 9:123
65. Xie C, Mao X, Huang J, Ding Y, Wu J, et al. 2011. KOBAS 2.0: a web server for annotation and identification of enriched pathways and diseases. *Nucleic Acids Research* 39:W316–W322
66. Li B, Dewey CN. 2011. RSEM: accurate transcript quantification from RNA-Seq data with or without a reference genome. *BMC Bioinformatics* 12:323
67. Love MI, Huber W, Anders S. 2014. Moderated estimation of fold change and dispersion for RNA-seq data with DESeq2. *Genome Biology* 15:550
68. Langfelder P, Horvath S. 2008. WGCNA: an R package for weighted correlation network analysis. *BMC Bioinformatics* 9:559
69. Zhang B, Horvath S. 2005. A general framework for weighted gene co-expression network analysis. *Statistical Applications in Genetics and Molecular Biology* 4:1–45
70. Vashisth T, Johnson LK, Malladi A. 2011. An efficient RNA isolation procedure and identification of reference genes for normalization of gene expression in blueberry. *Plant Cell Reports* 30:2167–76



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