RESEARCH Open Access



The mechanism of abscisic acid regulation of wild *Fragaria* species in response to cold stress

Jincheng Shen^{1,2,3}, Jie Liu¹, Yongge Yuan¹, Luxi Chen¹, Junxia Ma¹, Xin Li¹ and Junmin Li^{1*}

Abstract

Background: Abiotic stresses have increasingly serious effects on the growth and yield of crops. Cold stress, in particular, is an increasing problem. In this study, *Fragaria daltoniana* and *F. vesca* were determined to be cold-resistant and cold-sensitive species, respectively. Integrated transcriptomics and metabolomics methods were used to analyze the regulatory mechanism of abscisic acid (ABA) in *F. daltoniana* and *F. vesca* in their response to low temperature stress.

Results: *F. daltoniana* and *F. vesca* increased their ABA content under low temperature stress by upregulating the expression of the ABA biosynthetic pathway gene *NCED* and downregulating the expression of the ABA degradative gene *CYP707A*. Both types of regulation increased the accumulation of glucose and fructose, resulting in a reduction of damage under low temperature stress. Twelve transcription factors were found to be involved in the ABA regulatory pathway. The strong cold tolerance of *F. daltoniana* could be owing to its higher levels of ABA that accumulated compared with those in *F. vesca* under low temperature stress. In addition, the gene *ABF2*, which is related to the transduction of glucose signaling, was significantly upregulated in the leaves of *F. daltoniana*, while it was downregulated in the leaves of *F. vesca* under low temperature stress. This could contribute to the higher levels of glucose signal transduction in *F. daltoniana*. Thus, this could explain the higher peroxidase activity and lower damage to cell membranes in the leaves of *F. daltoniana* compared with *F. vesca* under low temperature stress, which endows the former with stronger cold tolerance.

Conclusions: Under low temperature stress, the differences in the accumulation of ABA and the expression trends of ABF2 and ABF4 in different species of wild strawberries may be the primary reason for their differences in cold tolerance. Our results provide an important empirical reference and technical support for breeding resistant cultivated strawberry plants.

Keywords: Low temperature stress, Wild strawberry, Abscisic acid, Glucose, Fructose

Introduction

Low temperature is a typical abiotic stress factor, which can significantly affect plant growth, development, and crop yields [1]. Low temperature stress is the primary reason for the decline in the yield and quality of many crops in temperate and arid regions [2]. The global annual loss of agricultural productivity caused by low temperature stress is approximately 2 billion USD [3]. Moreover, many agronomically important crops cannot



© The Author(s) 2022. **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and the use is not permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/. The Creative Commons Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

^{*}Correspondence: lijmtzc@126.com

¹ Zhejiang Provincial Key Laboratory of Plant Evolutionary Ecology and Conservation, Taizhou University, Taizhou 318000, China Full list of author information is available at the end of the article

Shen et al. BMC Genomics (2022) 23:670 Page 2 of 17

be improved by cold domestication, including rice, corn, soybeans, potatoes, cotton, and tomatoes [4]. Therefore, exploring the response and tolerance mechanism of plants under low temperature stress is highly important to improve the cold tolerance of plants and increase the quality and yield of crops.

Strawberry is highly nutritious and rich in vitamin C, anthocyanins, and other beneficial substances [5]. However, the resistance of cultivated strawberries is limited [6]. Improving the cold tolerance of strawberries is an important goal of strawberry breeding programs. As a species that is related to cultivated strawberry, wild strawberry can strongly resist stress and offers abundant germplasm resources for research on the mechanisms of resistance in the cultivated strawberry [7]. To accelerate the genetic improvement and breeding of cultivated strawberry, it is necessary to determine the responses of wild *Fragaria* species to low temperatures and the possible mechanisms they use to regulate them.

The cold stress response mechanisms of plants are very complex, and the signal pathways primarily include oxidation pathways, abscisic acid (ABA), mitogen-activated protein kinase, *Arabidopsis* response modifier, and Ca²⁺, among others [8]. ABA is a phytohormone that is found at low levels in plants but has substantial effects [9]. It plays an important role in the signal integration and regulation of the stress response genes in low temperature stress [9]. After binding to ABA receptors, ABA enhances the resistance of plants to stress by inducing changes in the expression of ABA-responsive genes, such as regulating the synthesis of osmotic adjustment substances that include proline, betaine and soluble sugar to reduce the loss of water from cells and maintain cell membrane stability [10, 11]; reducing the damage to plant photosynthesis from stress to ensure the synthesis of plant carbohydrates and energy metabolism [12]; upregulating the expression of antioxidant enzyme genes and enhancing the activity of antioxidant enzymes to reduce damage from the accumulation of reactive oxygen species (ROS) in the membrane system [13].

Genes that are involved in the cold response of strawberry leaves have been identified [14]. Chen et al. [14] found that environmental adaptation and carbohydrate metabolic pathways were significantly enriched in cultivated strawberries under low temperature stress and identified three CBF/DREB transcription factors and one cold-responsive (COR) gene that may play a role in cold resistance. In addition, various proteins and metabolites in strawberry have been evaluated [6, 15]. The cold tolerant mechanisms were also determined. For example, the exogenous application of ABA or glycine betaine has been verified to be effective in inducing cold tolerance in strawberry. Recently, an integrated analysis

of physiological indicators, transcriptomics and metabolomics was used to explore the network that strawberry uses to respond to low temperature stress. The cold signaling initiated the expression of downstream COR genes with the cis-acting element ABRE or CRT/ DRE in the ABA-independent or ABA-dependent pathways to induce plant defense against this stress. Notably, ABA also plays an important role in the cold tolerance of polyploidy Fragaria plants. An analysis of the transcriptomic changes in the autotetraploid strawberry F. nilgerrensis revealed that the coordination of Ca²⁺ signal transduction, transcription factors, ROS scavenging enzymes, phenylpropanoid biosynthesis, ABA signaling and carbohydrate metabolism play important roles in enhancing its resistance to cold stress. Notably, tetraploid F. moupinensis had higher concentrations of ABA and contents of soluble sugars and non-structural carbon (NSC), indicating that ABA has a regulatory role in the accumulation of soluble sugar and NSC in the responses of F. moupinensis to cold stress [16]. However, the mechanisms involved with the ABA regulatory pathway are still poorly understood.

Currently, research on the mechanisms of cold tolerance in strawberry mostly focuses on analyzing the responses observed through transcriptomic or metabolomic studies of plants under low temperature stress. In addition, the responses of cold-tolerant and cold-sensitive plant species differ [17], and the differences in the response mechanisms of strawberry species that differ in cold resistance are poorly understood. In this study, transcriptome, metabolome and physiological index data were integrated and analyzed to examine the regulatory mechanism of ABA in wild strawberry under low temperature stress. Our results provide an important empirical reference and key technical support for breeding resistant cultivated strawberry plants.

Results

Effect of low temperature stress on physiological indices

Low temperature stress increased the malondialdehyde (MDA) content and relative electrical conductivity (REC) of the leaves of *F. daltoniana* and *F. vesca*, while it caused the peroxidase (POD) activity to first decrease and then increase (Fig. 1). Compared with the leaves of untreated *F. daltoniana* and *F. vesca*, the POD activity of leaves of *F. daltoniana* and *F. vesca* both decreased significantly under low temperature treatment for 6 h, and the REC increased significantly (Fig. 1). The MDA content and REC in the leaves of *F. daltoniana* and *F. vesca* both increased significantly, and the POD activity of the leaves of *F. daltoniana* increased significantly under low temperature treatment for 12 h (Fig. 1).

Shen et al. BMC Genomics (2022) 23:670 Page 3 of 17

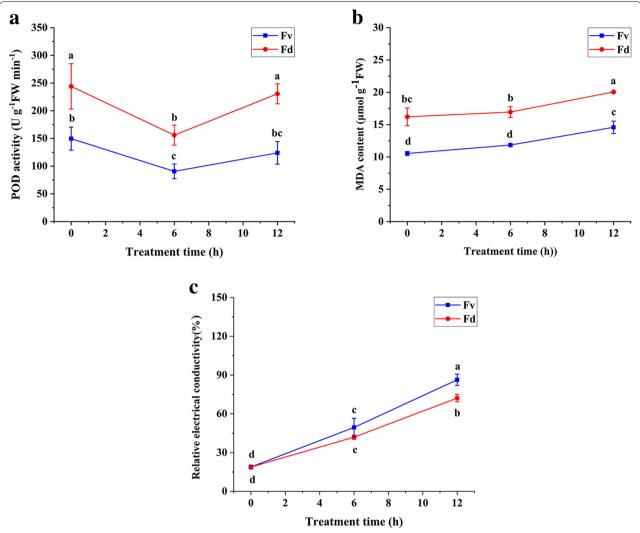


Fig. 1 The changes in peroxidase (POD) activity (**a**), malondialdehyde (MDA) content (**b**), and relative electrical conductivity (**c**) of wild strawberry leaves under low temperature stress. Fv, *Fragaria vesca*; Fd, *F. daltoniana*. Different lowercase letters indicate significant differences between different treatments

Effect of low temperature stress on ABA accumulation and signal transduction

Compared with the leaves of untreated *F. daltoniana* and *F. vesca*, the ABA content of leaves of *F. daltoniana* and *F. vesca* both increased significantly under 6 h and 12 h of low temperature treatment (Fig. 2a). A total of 28 DEGs were found to be involved in the biosynthesis of ABA and the degradation and signal transduction pathways of *F. daltoniana* and *F. vesca* under low temperature stress (Fig. 2b). Compared with the leaves of untreated *F. daltoniana* and *F. vesca*, the ABA biosynthetic pathway gene *NCED* (LOC101315210) in the *F. daltoniana* and *F. vesca* leaves was significantly upregulated, and the ABA degradative gene *CYP707A*

(LOC101299092) was significantly downregulated under low temperature stress (Fig. 2c). In addition, three genes that may play a role in the accumulation of ABA in wild strawberry leaves under low temperature stress were also detected, including <code>crtZ</code> (LOC101308227), <code>NCED</code> (LOC101293791), and <code>CYP707A</code> (LOC101294153). Compared with the leaves of untreated <code>F. daltoniana</code> and <code>F. vesca</code>, the expression of <code>crtZ</code> (LOC101308227) in the leaves of <code>F. daltoniana</code> was significantly upregulated under low temperature stress. The expression of <code>NCED</code> (LOC101293791) and <code>CYP707A</code> (LOC101294153) changed in different manners in the leaves of two wild strawberry species (Fig. 2c), indicating variation in the regulatory mechanisms of ABA biosynthesis between

Shen et al. BMC Genomics (2022) 23:670 Page 4 of 17

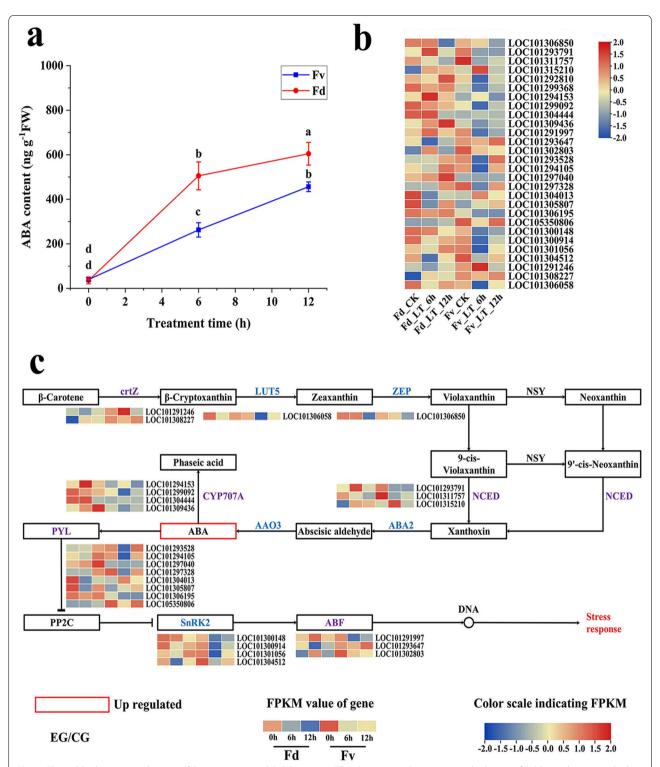


Fig. 2 The cold tolerance mechanism of *Fragaria vesca* and *F. daltoniana*. **a** The changes in ABA content in the leaves of wild strawberries under low temperature stress. **b** A heat map of genes related to the ABA pathway. **c** Synthesis, degradation and response pathways of ABA. Fv, *F. vesca*; Fd, *F. daltoniana*; CK, control group; LT, low temperature treatment; EG, experimental group; ABA, abscisic acid; FPKM, fragments per kilobase of transcript per million mapped fragments. Different lowercase letters indicate the significant differences between different treatments

Shen et al. BMC Genomics (2022) 23:670 Page 5 of 17

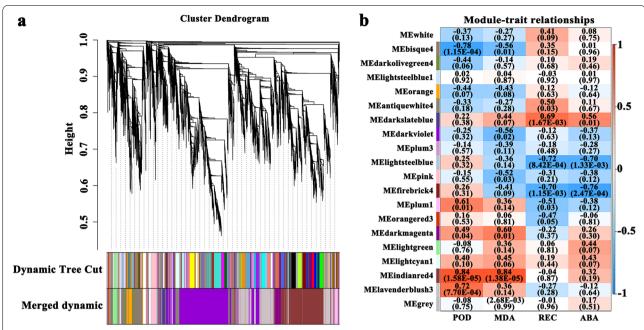


Fig. 3 Weighted gene co-expression network analysis of physiological traits and mRNAs. **a** Cluster dendrogram. **b** Correlation diagram characterizing the relationships between the modules and physiological indicators. ABA, abscisic acid; MDA, malondialdehyde; POD, peroxidase; REC, relative electrical conductivity

the two species. Compared with the leaves of untreated *F. daltoniana* and *F. vesca*, the expression level of *ABF4* (LOC101291997) in the *F. vesca* leaves was significantly downregulated, while that of *bZIP*3 (LOC101293647) was significantly downregulated in *F. daltoniana*. *ABF2* (LOC101302803) was significantly upregulated in *F. daltoniana* and downregulated in *F. vesca* under low temperature stress (Fig. 2c).

Weighted gene co-expression network analysis

To clarify the cold tolerance mechanism of wild strawberries, we combined the transcriptome and physiological indicators to construct a gene co-expression network of 18 strawberry samples under low temperature stress. After filtering out poorly expressed genes (fragments per kilobase of transcript per million mapped fragments [FPKM] < 0.5), the soft threshold was set to 27 by calculating the adjacency function between genes (Fig. S1). Twenty modules were constructed using the weighted gene co-expression network analysis (WGCNA) algorithm. In Fig. 3, the darkslateblue module is closely related to the REC and ABA content, and the indianred4 module is closely related to the POD activity and MDA content.

GO and KEGG function annotation and enrichment analyses

The Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) function annotation and enrichment analyses of the differentially expressed genes (DEGs) between the samples treated at low temperatures and the control samples and gene modules closely related to plant physiological indicators revealed that the "glycine, serine and threonine metabolic pathway" and "starch and sucrose metabolic pathway" may play important roles in the regulation of ABA in response to low temperature stress in wild strawberries (Figs. S2–S4).

Combined analysis of transcription and metabolism

After low temperature stress, the content of almost all the differentially accumulated amino acids in the leaves of F. daltoniana and F. vesca decreased significantly compared with the untreated leaves, indicating that the rate of consumption of amino acids in strawberry leaves was higher than that under low temperature stress. An analysis of amino acid metabolic pathway genes found that "tryptophan metabolism," "arginine and proline metabolism," "glycine, serine and threonine metabolism," "tyrosine metabolism," and "valine, leucine and isoleucine degradation" were differentially expressed. A total of 19 DEGs were significantly upregulated, including LOC101304511, LOC101313880, LOC101300079, LOC101311471, LOC101295227, LOC101293925, LOC101306855, LOC101291993, LOC101303901, LOC101304719, LOC101305686, LOC105349241, LOC101305018, LOC101294010, LOC101297378, LOC101293136, LOC101314462, LOC101296126, and

Shen et al. BMC Genomics (2022) 23:670 Page 6 of 17

LOC105351650 (Fig. 4a). These genes may play roles in amino acid metabolism. Choline dehydrogenase (CHDH) can catalyze choline, an intermediate product of glycine, serine, and threonine metabolism, to provide a substrate for the synthesis of dimethylglycine (Fig. 5). Compared with the leaves of untreated *F. daltoniana* and *F. vesca*, *CHDH* (LOC101303901) increased 3.77-, 3.31-, 2.45-, and 1.09-fold under 6 and 12h of low temperature stress in *F. daltoniana* and *F. vesca*, respectively, and the content of dimethylglycine increased 54.65-, 53.53-, 7.87-, and 7.28-fold, respectively (Fig. 6, Table 1, and Table S3). Therefore, *CHDH* (LOC101303901) may play a key role in the amino acid metabolic pathway of wild strawberry leaves under low temperature stress.

Compared with the leaves of untreated F. daltoniana, 22 significantly upregulated genes were detected in the "starch and sucrose metabolism" pathway of F. daltoniana under low temperature stress, including LOC101294848, LOC101302768, LOC101302472, LOC101306340, LOC101295419, LOC101310320, LOC101313544, LOC101292336, LOC101295133, LOC101314273, LOC101295471, LOC101312726, LOC101309367, LOC101293767, LOC101314074, LOC101306635, LOC101300431, LOC101309070, LOC101309653, LOC101310968, LOC101313667, and LOC101293910 (Fig. 4b). These genes may play roles in the breakdown of sucrose into fructose and glucose. Endoglucanase can catalyze cellulose, the intermediate metabolite of the sucrose metabolic pathway, to provide a substrate for glucose synthesis (Fig. 6). Compared with the leaves of untreated F. daltoniana, endo 1,4-β-D-glucanase (EGase, LOC101313667) was upregulated 6.17- and 8.79-fold in the leaves of *F. daltoniana* under 6 and 12 h of low temperature stress, respectively; the glucose content increased 3.63- and 3.83-fold, respectively, and the sucrose content decreased 2.06- and 2.48-fold, respectively (Figs. 4b and 6, Tables 2 and S4). Therefore, the differential expression of EGase (LOC101313667) under low temperature stress is likely to affect the ratio of sucrose to glucose in leaves.

Transcription factor prediction of the modular genes

The transcription factors were predicted based on the genes in the darkslateblue module that were closely related to the REC and ABA content, and nine differentially expressed transcription factors were identified (Fig. 4c). Each of the seven B3, bZIP, ERF, G2-like, GRAS, LBD, and MYB transcription factor families has one, and the NF-YB transcription factor family has two (Table 3).

Relation analysis between transcription factors and Core module genes

A correlation analysis of differentially expressed transcription factors in the ABA module and the DEGs of

starch and sucrose metabolic pathways and amino acid metabolic pathways was performed. The eight differentially expressed transcription factors were significantly correlated with the DEGs of 10 amino acid metabolic pathways (P<0.05, R>0.8). Nine differentially expressed transcription factors were significantly correlated with the DEGs of 17 starch and sucrose metabolic pathways (P<0.05, R>0.8) (Fig. 7).

qRT-PCR validation

To verify the accuracy of the transcriptome sequencing results, we selected six DEGs that responded to low temperature stress for qRT-PCR validation. As shown in Fig. 8, the trends of expression of the six genes are basically consistent with the transcriptome sequencing results, which demonstrates that the transcriptome sequencing results are highly reliable and can be used to examine the cold tolerance mechanism of wild strawberries.

Discussion

Physiological response of wild strawberry under low temperature stress

The contents of REC and MDA in the leaves of F. daltoniana and F. vesca increased significantly under low temperature stress, while the POD activity first decreased significantly and then increased. These patterns could be owing to a reduction in the activity of ROS scavenging enzymes in response to the low temperature stress. An imbalance between ROS generation and scavenging leads to a large accumulation of ROS and membrane lipid peroxidation to synthesize MDA, which causes damage to the cell components and cell membranes, resulting in a significant increase in REC [18]. Previous studies have shown that the accumulation of ABA is essential for cold tolerance in plants. ABA can increase the content of osmotic adjustment substances in plants and the activity of ROS scavenging enzymes by regulating the expression of stressresponsive genes, thereby improving the cold tolerance of plants [19, 20]. The ABA contents in the leaves of the untreated F. daltoniana and F. vesca were very similar. After low temperature stress, the ABA content in the leaves of the two wild strawberries increased significantly, and the ABA content in the leaves of F. daltoniana (strong cold tolerance) was significantly higher than that of F. vesca (weak cold tolerance). After low temperature stress, the POD activity of the leaves of F. daltoniana was higher than that of F. vesca, and the REC was lower than that of F. vesca. Therefore, the accumulation of ABA in wild strawberry leaves under low temperature stress may affect its POD activity,

Shen et al. BMC Genomics (2022) 23:670 Page 7 of 17

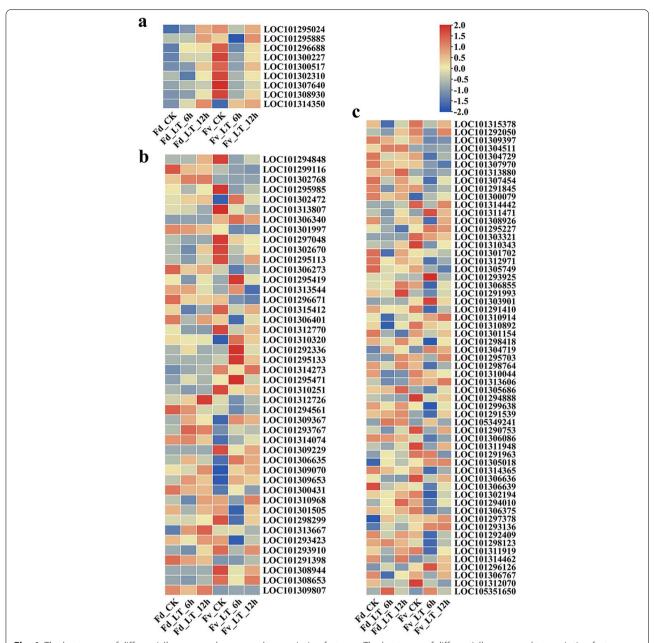


Fig. 4 The heat maps of differentially expressed genes and transcription factors. **a** The heat map of differentially expressed transcription factors in ABA content-related gene modules. **b** The DEGs in starch and sucrose metabolic pathways. **c** The DEGs in amino acid metabolic pathway. Fv, *F. vesca*; Fd, *F. daltoniana*; CK, control group; LT, low temperature treatment; DEGs, differentially expressed genes; ABA, abscisic acid

improve the scavenging ability of ROS, reduce the oxidative damage caused by ROS, and protect the stability of the cell membrane structure.

Sugar accumulation pathway of wild strawberry under low temperature stress

Plants often produce protective compounds, such as amino acids and soluble carbohydrates, in response to low temperature stress to reduce cell damage and preserve cell metabolism [16]. Previous studies showed that cold-tolerant plants accumulate more soluble carbohydrates and amino acids under low temperature stress than cold-sensitive plants [21, 22]. For example, Niu et al. [23] found that 37 amino acids and 33 sugars were accumulated in *Momordica charantia* seedlings with higher cold tolerance under low temperature, at higher

Shen et al. BMC Genomics (2022) 23:670 Page 8 of 17

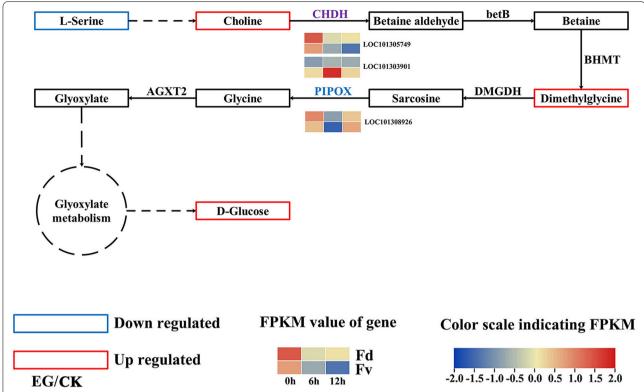


Fig. 5 Metabolic pathway diagram of wild strawberry glycine, serine, and threonine. Fv, F. vesca; Fd, F. daltoniana; EG, experimental group; CK, control group; CHDH, choline dehydrogenase; PIPOX, sarcosine oxidase / L-pipecolate oxidase

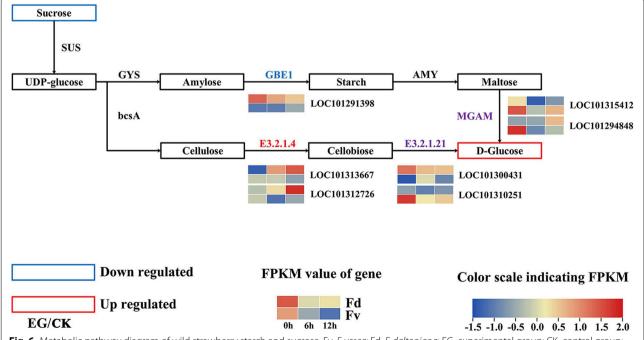


Fig. 6 Metabolic pathway diagram of wild strawberry starch and sucrose. Fv, *F. vesca*; Fd, *F. daltoniana*; EG, experimental group; CK, control group; GBE1, 1,4-α-glucan branching enzyme; E3.2.1.4, *endo 1,4-β-p-glucanase*; E3.2.1.21, β-glucosidase; MGAM, maltase-glucoamylase

Shen et al. BMC Genomics (2022) 23:670 Page 9 of 17

Table 1 The content of amino acids and intermediate metabolites in their metabolic pathways in leaves of *F. vesca* and *F. daltoniana* under cold stress

Metabolite	Fd_CK	Fd_LT_6h	Fd_LT_12h	Fv_CK	Fv_LT_6h	Fv_LT_12h
L-Arginine	3.75E+06	1.59E+06	1.66E+06	3.89E+05	3.94E+05	4.46E+05
L-Asparagine	1.64E+07	8.10E+06	6.68E+06	3.90E+05	3.98E+05	3.02E+05
L-Aspartic Acid	8.49E+06	2.38E+06	1.62E+06	2.10E+06	1.02E+06	7.64E + 05
L-Citrulline	1.12E+05	3.64E + 04	5.01E+04	2.03E+04	3.96E+04	1.40E + 04
L-Cysteine	6.08E+04	5.91E+04	4.20E+04	5.51E+04	5.14E+04	4.38E+04
L-Cystine	1.46E+04	5.23E+04	3.97E+04	8.47E+03	3.05E+04	2.55E + 04
L-Glutamic acid	5.90E+07	1.52E+07	8.20E+06	3.04E + 07	1.63E+07	1.24E+07
L-Histidine	1.04E+05	7.77E + 04	6.13E+04	3.36E+04	3.35E+04	4.03E+04
L-Homocitrulline	1.70E+04	1.89E+04	2.35E+04	2.30E+04	1.96E+04	3.34E+04
L-Homocystine	1.89E+04	2.53E+04	2.84E+04	2.01E+04	2.71E+04	3.56E+04
L-Homomethionine	1.37E+05	5.99E+04	5.13E+04	6.44E+04	5.55E+04	4.75E+04
L-Isoleucine	4.46E+06	5.50E+06	5.75E+06	5.57E+06	5.01E+06	4.85E+06
L-Leucine	4.24E+06	5.31E+06	5.72E+06	5.38E+06	4.61E+06	4.61E+06
L-Lysine	1.31E+06	1.09E+06	1.11E+06	9.64E+05	1.12E+06	1.05E+06
L-Methionine	3.57E+05	6.18E+05	6.73E+05	3.40E+05	3.79E+05	3.54E+05
L-Norleucine	4.30E+06	5.21E+06	5.90E+06	5.53E+06	5.05E+06	4.89E+06
L-Ornithine	9.99E+05	5.04E+05	4.48E+05	2.21E+04	2.90E+04	2.16E+04
L-Phenylalanine	8.43E+06	1.02E+07	1.21E+07	5.10E+06	6.38E+06	6.83E+06
L-Proline	1.68E+07	1.65E+07	1.75E+07	1.52E+07	2.19E+07	1.57E+07
L-Serine	1.80E+06	7.16E+05	1.11E+06	1.70E+05	1.60E+05	1.26E+05
L-Threonine	4.31E+06	2.70E+06	2.21E+06	2.23E+06	1.73E+06	1.71E+06
L-Tryptophan	2.89E+06	3.22E+06	3.18E+06	2.23E+06	2.82E+06	4.37E+06
L-Tyrosine	8.62E+06	6.74E+06	8.97E+06	8.08E+06	1.30E+07	1.39E+07
L-Valine	3.86E+07	3.86E+07	3.68E+07	4.25E+07	4.45E+07	3.54E+07
Dimethylglycine	2.46E+05	1.34E+07	1.31E+07	1.20E+06	9.45E+06	8.74E+06

 Table 2 The sugar content of leaves of F. vesca and F. daltoniana under cold stress

Metabolite	Fd_CK	Fd_LT_6h	Fd_LT_12h	Fv_CK	Fv_LT_6h	Fv_LT_12h
D-(—)-Threose	1.80E+06	1.07E+06	7.14E+05	4.78E+04	7.50E+04	7.34E+04
D-Arabinose	4.88E+04	6.70E+04	9.72E+04	5.02E+04	8.39E+04	1.33E+05
D-Fructose	1.50E+06	5.83E+06	6.10E+06	2.14E+06	6.07E+06	9.13E+06
D-Glucose	1.59E+06	5.76E+06	6.08E+06	2.11E+06	6.05E+06	8.88E+06
D-Lactulose	8.42E+05	3.88E+05	4.18E+05	1.09E+06	7.77E+05	1.12E+06
D-Maltose	1.28E+06	8.74E+05	6.86E+05	2.44E+06	2.33E+06	3.15E+06
D-Panose	5.45E+03	3.67E+03	9.00E+00	2.66E+04	2.30E+04	3.66E+04
D-Ribose	1.46E+05	2.01E+05	1.78E+05	8.44E+04	1.46E+05	1.59E+05
D-Sucrose	3.09E+06	1.50E+06	1.25E+06	4.01E+06	3.10E+06	3.99E+06
D-Trehalose	7.88E+05	5.41E+05	6.08E+05	1.28E+06	1.13E+06	1.41E+06
Isomaltulose	1.62E+06	9.10E+05	9.57E+05	2.49E+06	2.20E+06	2.65E+06
Lactobiose	1.36E+06	7.65E+05	8.53E+05	2.35E+06	2.19E+06	2.55E+06
Melibiose	9.72E+05	5.44E+05	5.73E+05	1.36E+06	1.27E+06	1.51E+06
Raffinose	3.39E+04	1.60E+04	1.68E+04	1.18E+05	6.92E+04	1.13E+05
Sedoheptulose	6.58E+05	7.12E+05	6.91E+05	2.44E+05	3.02E+05	3.95E+05
Turanose	4.60E+06	2.95E+06	3.20E+06	2.86E+06	3.06E+06	2.19E+06

Shen et al. BMC Genomics (2022) 23:670 Page 10 of 17

Table 3 Family classification of differentially expressed transcription factors in abscisic acid (ABA) content-related gene modules

Gene ID	Transcription factor family	Transcription factor
LOC101300517	В3	MJB21.7
LOC101307640	bZIP	GBF1
LOC101314350	ERF	ERF9
LOC101295024	G2-like	PCL1
LOC101302310	GRAS	RGL1
LOC101300227	LBD	LBD1
LOC101296688	MYB	TT2
LOC101295885	NF-YB	NF-YB2
LOC101308930	NF-YB	NF-YB11

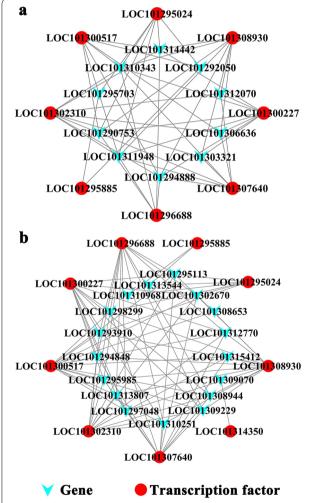


Fig. 7 Network map of the differentially expressed transcription factors and genes. **a** Network map of the differentially expressed transcription factors and genes of the amino acid metabolic pathway. **b** Network map of the differentially expressed transcription factors and genes of the starch and sucrose metabolic pathways

levels than in seedlings with lower cold tolerance. However, in this study, the metabolomics data showed that the amino acid content in the leaves of F. daltoniana and F. vesca under lower temperature stress was significantly lower than those under normal temperature. The glucose and fructose contents increased significantly, and the sucrose content in the leaves of F. daltoniana decreased significantly. The sucrose content of F. vesca leaves decreased first and then increased to the level of the control group. The products of the carbohydrate and ketogenic amino acid metabolic pathways can be catalyzed to synthesize carbohydrates by a series of enzymes [24]. Therefore, the increase in glucose and fructose content is likely to be related to the metabolism of amino acids and sucrose. The amino acid content is affected by the genes of amino acid biosynthetic and metabolic pathways, while the carbohydrate content is affected by photosynthesis, sucrose and amino acid metabolism, and other gluconeogenesis pathways [24, 25]. Therefore, the upregulated genes involved in glycogenic amino acid metabolic, sugar-producing and ketogenic amino acid metabolic, and sucrose metabolic pathways in wild strawberry leaves may play important roles in changes in carbohydrate content under low temperature stress.

Choline dehydrogenase (CHDH) is an important enzyme in the glycine, serine, and threonine metabolic pathway (map 00260), which can catalyze choline, the intermediate product of this metabolic pathway to betaine aldehyde [26]. Betaine aldehyde is catalyzed by betaine aldehyde dehydrogenase, choline oxidase, and betaine homocysteine methyltransferase to synthesize dimethylglycine, which then enters the glyoxylic acid metabolic pathway under the catalysis of a series of enzymes to provide sufficient substrates for glucose synthesis. Compared with the leaves of untreated F. daltoniana and F. vesca, the levels of expression of CHDH (LOC101303901) in F. daltoniana and F. vesca leaves after 6 and 12h of low temperature stress were upregulated 3.77-, 3.31-, 2.45-, and 1.09-fold, respectively; the glycine content increased 54.65-, 53.53-, 7.87-, and 7.28-fold, respectively; the glucose content increased 3.63-, 3.83-, 2.86-, and 4.20-fold, respectively, and the fructose content increased 3.88-, 4.07-, 2.84-, and 4.28-fold, respectively. This indicates that *CHDH* is likely to play a key role in the amino acid metabolism and carbohydrate biosynthesis of wild strawberry under low temperature stress. Previous research has shown that the overexpression of CHDH in corn (Zea mays) can increase its soluble sugar and free amino acid content and thereby improve its cold tolerance [27]. Therefore, CHDH (LOC101303901) may be a key gene for low temperature tolerance in wild strawberries.

Shen et al. BMC Genomics (2022) 23:670 Page 11 of 17

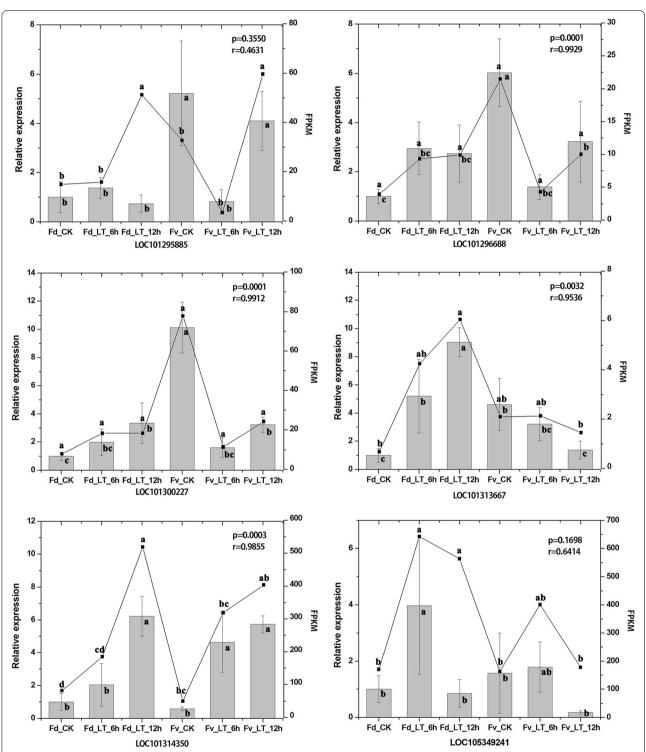


Fig. 8 qRT-PCR validated the differentially expressed genes of the leaves of wild strawberries under low temperature stress. The bar graphs show the relative expression as measured by qRT-PCR, and the broken line graphs are the gene expression estimates obtained by RNA-Seq. Fv, *Fragaria vesca*; Fd, *F. daltoniana*; CK, control group; LT, low temperature treatment. qRT-PCR, real-time fluorescent quantitative reverse transcription PCR. Different lowercase letters indicate significant differences between different treatments

Shen et al. BMC Genomics (2022) 23:670 Page 12 of 17

Compared with the leaves of untreated *F. daltoniana*, 22 starch and sucrose metabolic pathway genes in the leaves of *F. daltoniana* were significantly upregulated under low temperature stress. Cellulose, an intermediate metabolite of sucrose metabolism, can be catalyzed by endoglucanase to produce cellobiose and then catalyzed by β-glucosidase to produce glucose. Compared with the leaves of untreated *F. daltoniana*, after 6 and 12h of low temperature stress, *EGase* (LOC101313667) increased 6.17- and 8.79-fold, respectively; the glucose content increased 3.63- and 3.83-fold, respectively, and the sucrose content decreased 2.06- and 2.48-fold in the leaves of *F. daltoniana*, respectively.

The abscisic acid regulatory mechanism of wild strawberry in response to cold stress

Compared with the leaves of untreated F. daltoniana and F. vesca, the ABA biosynthetic pathway gene NCED (LOC101315210) was significantly upregulated in the leaves of F. daltoniana and F. vesca under low temperature stress, while the ABA degradative gene CYP707A (LOC101299092) was significantly downregulated. NCED is an important gene that restricts the ABA biosynthetic pathway, and its expression is positively correlated with ABA content in plants [28]. Okamoto et al. found that ABA degradation was reduced in Arabidopsis CYP707A mutants [29]. Therefore, NCED (LOC101315210) and CYP707A (LOC101299092) may play important roles in the accumulation of ABA in wild strawberry leaves under low temperature stress. ABA can phosphorylate SnRK2 by binding to PP2C and inhibiting it, thereby activating the enzymatic activity of SnRK2 [30]. Afterwards, SnRK2 phosphorylates ABF transcription factors and regulates the expression of ABA-induced genes [31]. Previous research has shown that ABF2 plays an important role in glucose signal transduction and that overexpression can increase the sensitivity of plants to glucose and ABA, thereby enhancing plant resistance [32]. Additionally, the overexpression of ABF3 and ABF4 can improve plant cold tolerance and ABA sensitivity [33]. Therefore, compared with the leaves of untreated F. daltoniana and F. vesca, ABF2 (LOC101302803) was significantly upregulated in the leaves of F. daltoniana and downregulated in the leaves of *F. vesca* under low temperature stress, which may indicate that glucose signal transduction functions at a higher level in F. daltoniana under low temperature stress. After low temperature stress, ABF4 (LOC101291997) was significantly downregulated in F. vesca leaves, which reduced its sensitivity to ABA. The difference in the trends of expression of ABF2 (LOC101302803) and ABF4 (LOC101291997) in the leaves of F. daltoniana and F. vesca under low temperature stress could explain the stronger cold tolerance of *F. daltoniana*.

The transcription factors were predicted for the genes of the darkslateblue module that were closely related to REC and ABA content, and thus, nine differentially expressed transcription factors were found, including MJB21.7, GBF1, ERF9, PCL1, RGL1, LBD1, TT2, NF-YB2, and NF-YB11. Studies have shown that NF-YB2, RGL1, ERF9, and GBF1 play important roles in plant resistance mechanisms [34-37]. Sato et al. found that the overexpression of NF-YB2 can significantly enhance drought tolerance by regulating the expression of genes that respond to drought stress, and it is likely to play a role in the ABA-dependent pathway [34]. Achard et al. found that RGL1 can reduce the accumulation of ROS in plants under stress, thereby delaying cell death and enhancing plant tolerance [35]. Dong et al. found that the level of expression of citrus CitERF9 was induced by stress and ABA [37]. ABI5 is an important transcription factor in the ABA-dependent pathway, which can enhance plant stress resistance by regulating the accumulation of osmotic regulators and eliminating ROS [38]. Sun et al. found that the overexpression of TaGBF1 positively regulates the expression of ABI5 and increases the salinity and ABA sensitivity of wheat (Triticum aestivum) and Arabidopsis [36]. Therefore, NF-YB2 (LOC101295885), RGL1 (LOC101302310), ERF9 (LOC101314350), and GBF1 (LOC101307640) are likely to play important roles in the cold resistance mechanisms of wild strawberries. In particular, GBF1 (LOC101307640) may regulate the accumulation of glucose and fructose in wild strawberry leaves and the elimination of ROS under low temperature

A correlation analysis revealed that the expression levels of nine differentially expressed transcription factors significantly are correlated with the expression levels of 17 differentially expressed genes in the starch and sucrose metabolic pathways (P < 0.05, R > 0.8). Expression levels of eight of these differentially expressed transcription factors (all except ERF9) were significantly correlated with the expression levels of 10 differentially expressed genes in the amino acid metabolic pathways. This indicates that the differentially expressed transcription factors of the darkslateblue module that were detected are likely to play important roles in the ABA-regulated resistance mechanism of wild strawberry under low temperature stress, particularly for the expression of genes in the starch and sucrose metabolic and amino acid metabolic pathways and the elimination of ROS.

Thus, low temperature stress reduced the activity of POD in the leaves of *F. daltoniana* and *F. vesca*, which is likely to cause a large accumulation of ROS, resulting in a significant increase in MDA content and cell membrane

Shen et al. BMC Genomics (2022) 23:670 Page 13 of 17

damage (a significant increase in REC), thereby affecting the function of wild strawberry cells. Under low temperature stress, wild strawberry may increase the accumulation of ABA by upregulating the expression of *NCED* (LOC101315210) and downregulating the expression of *CYP707A* (LOC101299092). Under low temperature stress, the ABA content in the leaves of *E. daltoniana* (strong cold tolerance) is significantly higher than that of *E. vesca* (weak cold tolerance) leaves, which could be the root cause of its stronger cold tolerance.

Under low temperature stress, wild strawberry may regulate the expression of transcription factors, such as NF-YB2 (LOC101295885), RGL1 (LOC101302310), ERF9 (LOC101314350), and GBF1 (LOC101307640), and other transcription factors through ABA to regulate the metabolic pathway genes of sugar-producing amino acids and sugar-producing and ketogenic amino acids to provide more substrates for the biosynthesis of carbohydrates and regulate the level of expression of genes in the starch and sucrose metabolic pathways. These activities significantly increase the glucose and fructose content and the activity of ROS scavenging enzymes, including POD, to eliminate ROS. The primary osmotic adjustment substances that accumulated in wild strawberry leaves under low temperature stress are glucose and fructose, which may play important roles in its mechanism of cold tolerance. The levels of expression of CHDH (LOC101303901) and EGase (LOC101313667) may play key roles in the accumulation of glucose and fructose in strawberry under low temperature stress. GBF1 (LOC101307640) may regulate the levels of expression of CHDH (LOC101303901) and EGase (LOC101313667) under low temperature stress. In addition, compared with the leaves of untreated F. daltoniana and F. vesca, ABF2 (LOC101302803) was significantly upregulated in the leaves of F. daltoniana and significantly downregulated in those of F. vesca under low temperature stress, which suggests that glucose signal transduction plays a greater role in F. daltoniana under low temperature stress. Compared with the leaves of untreated F. vesca, the level of expression of ABF4 (LOC101291997) was significantly downregulated in F. vesca leaves under low temperature stress, which may reduce its sensitivity to ABA. Thus, this may be one of the reasons for the weak cold tolerance of this species.

Materials and methods

Plant materials

Five diploid *Fragaria* species, including *F. nilgerrensis*, *F. vesca*, *F. nubicola*, *F. daltoniana*, and *F. pentaphylla*, were cultivated in a greenhouse at Taizhou University, Taizhou, China. On November 1st, 2020, we selected 20 stolons with five nodes from each species and transplanted them

into plastic pots with a diameter of 7.5 mm and filled with a mixture of soil, bark, vermiculite, and sand with a ratio of 2:1:1:2 (ν : ν : ν : ν). The temperature was maintained at 20/14°C (day/night), and the relative humidity was 75% [16]. After 1 week of cultivation, the stolons were cut from a single plant. Eight-week-old seedlings were used in the next experiment.

Cold tolerance evaluation

The cold resistance of the five *Fragaria* species was determined as described by Xue et al. [39]. In brief, leaf discs with a diameter of 6 mm that lacked veins were generated using a hole puncher, washed with distilled water, dried with filter paper, placed on 1 cm thick wet sand prepared in a Petri dish, and then placed at 4°C for 12h. The leaves were treated at temperatures of 0° C, -4° C, -8° C, -12 °C, -16 °C, -20 °C for 12 h, and the temperature was reduced at a rate of 1°C/h. The frozen leaves were thawed for 12h at 4°C and placed in a centrifuge tube. A volume of 6 mL of deionized water was added to keep the leaves submerged. The samples were then placed under vacuum for 30 min and shaken for 3 h. The electrical conductivity (R₁) at room temperature was then measured using a DDSJ-308A conductivity meter (Shanghai INESA Scientific Instrument Co., Ltd., Shanghai, China). Afterwards, the solution was autoclaved for 20 min at 122 °C to completely dissolve the plant cell wall and measure the electrical conductivity (R_2) . Each treatment consisted of three biological replicates and three technical replicates.

$$REC = R_1/R_2 \times 100\% \tag{1}$$

$$y = K/\left(1 + ae^{-bx}\right) \tag{2}$$

$$\ln\left[\left(K-y\right)/y\right] = \ln a - bx \tag{3}$$

$$LT_{50} = -(\ln a)/b \tag{4}$$

Here, y is the relative electrical conductivity (REC); x is the treatment temperature; K is the maximum limit value of y, and a and b are the parameters of Eq. 4. LT₅₀ is the temperature at which 50% of the population died [39].

Experimental design

Based on the ability of five *Fragaria* species to tolerate cold (Table S1), *F. nilgerrensis* was selected as the cold-tolerant species, while *F. vesca* was selected as the cold-sensitive species. Before the low temperature treatment (0h), the central lobules of *F. nilgerrensis* and *F. vesca* were collected as the control group for subsequent experiments. *F. nilgerrensis* and *F. vesca* were then placed

Shen et al. BMC Genomics (2022) 23:670 Page 14 of 17

in an illuminated artificial climate chamber at $-5\,^{\circ}\text{C}$, and the samples were collected after 6h and 12h of low temperature treatment. The sample collection method was the same as that of the control group. The samples were divided into two groups. One group was immediately used to assay the activity of peroxidase (POD) and determine the relative electrical conductivity (REC) and malondialdehyde (MDA) content, while the other group was immediately frozen in liquid nitrogen and stored at $-80\,^{\circ}\text{C}$ to determine the ABA content and perform transcriptome sequencing and metabolomic identification.

Physiological index measurement Assay for peroxidase activity

A volume of 5 mL of 50 mM Na phosphate buffer (pH=7.8) was added to 0.5 g of leaves, ground into a homogenate and centrifuged for 20 min at 10,000 rpm at 4 °C. The supernatant was transferred to a new tube. The POD activity was determined by the nitrogen blue tetrazolium (NBT) photochemical reduction method [40]. The reaction system included 50 mM phosphate buffer (pH7.8), 13 mM methionine, 75 mM NBT, 0.1 mM EDTA, 50 mM Na₂CO₃, and 100 μ L of crude enzyme solution. The reaction solution was irradiated with two 20 W fluorescent tubes for 15 min. The reaction solution was subjected to colorimetric analysis at 560 nm, and a reduction of 50% in the absorbance of NBT was considered to be one unit of activity (U).

Determination of the malondialdehyde content

A volume of 10 mL of 10% trichloroacetic acid (TCA) and 1g of fresh leaves were added to a mortar and ground. The homogenate was centrifuged at 10,000 rpm at 4°C for 20 min. The reaction mixture that contained 2 mL of extract and 2 mL of 0.6% thiobarbituric acid (TBA) was placed in a water bath at 95°C for 30 min, quickly cooled on ice, and then centrifuged again at 10,000 rpm for 20 min. The absorbance of the supernatant was measured at 532, 600, and 450 nm with a T6 New Century UV-VIS spectrophotometer (Beijing Persee General Instrument Co. Ltd., Beijing, China), and $\rm A_{532}$, $\rm A_{600}$, and $\rm A_{450}$ were obtained, respectively [41].

MDA content =
$$6.45 \times (A_{532}-A_{600})-0.56 \times A_{450}$$
 (5)

Determination of relative electrical conductivity

The REC was the same as that determined in section 4.2.

Determination of abscisic acid content

The frozen leaves were ground to powder with an MM 400 grinder (Retsch Technology GmbH, Haan,

Germany). A total of 50 mg of powder was added with an appropriate amount of internal standard and extracted with 1 mL of methanol:water:formic acid (15:4:1, ν : ν : ν). After concentration, it was reconstituted with 100 μ L of 80% methanol and filtered through a 0.22- μ m membrane. Ultra performance liquid chromatography (UPLC) (ExionLCTM AD, https://sciex.com.cn/) and tandem mass spectrometry (QTRAP® 6500+, https://sciex.com.cn/) were used to determine the concentrations of hormones as described by Chen et al. [42].

Transcriptomic analysis

Total RNA extraction, library construction, and transcriptome sequencing

The total RNA was extracted using a TRIzol kit (B511311; Sangon, Shanghai, China) according to the manufacturer's instructions. The purity and concentration of RNA were detected by spectrophotometry (IMPLEN, Westlake Village, CA, USA) and a Qubit® RNA Analysis Kit (Life Technologies Corporation, Carlsbad, CA, USA). The integrity of RNA was evaluated by an RNA Nano 6000 Analysis Kit on an Agilent 2100 Bioanalyzer (Agilent Technologies, Santa Clara, CA, USA). A VAHTSTM mRNA-seq V2 Library Preparation Kit (Illumina, San Diego, CA, USA) was used to generate the sequencing libraries. A HiSeq X Ten sequencer (Illumina) was used for paired-end sequencing of the library. The extraction of total RNA and sequencing was completed by Shenggong Bioengineering Co., Ltd. (Shanghai, China).

Sequence alignment

First, we used FastQC (version 0.11.2) to remove low-quality sequencing reads in the original data, such as adaptor sequences and low-quality bases. After that, we used HISAT2 (version 2.1.0) software to compare the filtered data to the genome of the strawberry model species *E. vesca* under the default parameters of the software (https://www.ncbi.nlm.nih.gov/assembly/GCA_000184155.1).

Identification and analysis of differentially expressed genes

The differentially expressed genes (DEGs) were screened using DESeq software (version 1.12.4), according to the following criteria: q-value <0.001, |Fold Change| > 2. The Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) enrichment analyses of DEGs were performed using the topGO (version 2.24.0) and clusterProfiler (version 3.0.5) packages for the R statistical computing environment, respectively [43–46].

Transcription factor prediction

The sequence file was uploaded to the PlantTFDB website to predict the transcription factors (http://planttfdb.cbi.pku.edu.cn/index.php) [47].

Shen et al. BMC Genomics (2022) 23:670 Page 15 of 17

Weighted gene co-expression network analysis (WGCNA)

The WGCNA software package in R (version 3.6.3) was used for the WGCNA analysis of mRNAs and plant physiological indicators as described by Lu et al. [16]. After filtering out genes with a low level of expression (fragments per kilobase of transcript per million mapped fragments [FPKM] < 0.5), the threshold parameter (β value) was determined and established by the soft threshold method. Then, the correlation coefficient between expression levels of genes was converted by the adjacency function to form an adjacency matrix, which was then converted into a topological matrix based on the TOM similarity algorithm. The degree of difference between expression levels of the genes was calculated based on this. The minimum number of genes in the module was set to 30, and the hybrid dynamic shearing tree method was used to generate a dendritic clustering graph. After the module was constructed, the correlation analysis between the module and the phenotype was performed, and the GO and KEGG enrichment analyses of the target module gene were conducted.

Correlation analysis

The Pearson correlation coefficients between the DEGs and transcription factors, the \log_2 conversion of expression levels of DEGs and of accumulation levels of metabolites were calculated using the Cor function in R (version 3.5.1). CytoScape (version 3.6.1) software (Shannon, 2003) was used to visualize the data for which P < 0.05 and R > 0.8 [48].

qRT-PCR experiment

To verify the mRNA expression pattern identified by RNA-Seq, six DEGs were screened, and their levels of expression were verified by real-time fluorescent quantitative reverse transcription PCR (qRT-PCR) on a C1000 Touch fluorescent quantitative PCR instrument (Bio-Rad Co. Ltd., Hercules, CA, USA). The primers (Table S2) were designed using Primer Premier 5.0 and synthesized by Sangon Biotech Co., Ltd. (Shanghai, China). The strawberry actin gene was used as an internal reference gene, and the relative expression of the gene was calculated by the $2^{-\Delta\Delta CT}$ method. All qRT-PCR experiments contained three sets of biological replicates and three sets of technical replicates.

Metabolomic analysis

Frozen leaves were ground at 30 Hz with an MM 400 grinder (Retsch Technology GmbH, Haan, Germany) for 1.5 min. A total of 100 mg of powder was dissolved in a 1.0-mL solution of methanol that contained 0.1 mg/L lidocaine (internal standard) and 70% methanol. The

samples were incubated overnight at 4° C, during which they were shaken three times to ensure a more thorough extraction. After extraction, the samples were centrifuged for $10 \, \text{min}$ at 4° C at $10,000 \, \text{rpm}$, and the supernatants were filtered through $0.22 \, \text{\mu m}$ membranes.

As described by Wei et al. [49], the metabolites were identified and quantified by UPLC and tandem mass spectrometry (MS/MS, Applied Biosystems QTRAP, http://www.appliedbiosystems.com.cn/). The conditions for the liquid phase are described as follows: the chromatographic column was an Agilent SB-C18 $(1.8 \,\mu\text{m}, 2.1 \,\text{mm} \times 100 \,\text{mm})$; the mobile phase was ultrapure water that contained 0.1% formic acid as phase A and acetonitrile that contained 0.1% formic acid as phase B; the elution gradient was set to 5% of phase B at 0 min, the ratio of phase B increased linearly to 95% within 9 min, which was maintained for 1 min, at 10-11 min, the ratio of phase B was reduced to 5%, and the ratio was balanced to 14 min.

The operating parameters of the ESI source were set as follows: ion source, turbo spray; source temperature, $550\,^{\circ}\text{C}$; ion spray voltage, $5500\,\text{V}$; ion source gas I, gas II, and curtain gas pressures, 55, 60, and $25\,\text{psi}$ respectively; collision-induced ionization parameter, high. In the QQQ and LIT modes, 10 and $100\,\mu\text{mol/L}$ polypropylene glycol solutions were used to tune the instrument and calibrate the mass, respectively. A QQQ scan selected the multiple reaction monitoring (MRM) mode, and the collision gas (nitrogen) was set to medium.

The metabolites were analyzed qualitatively based on HMDB (http://www.hmdb.ca/), MassBank (http://www.massbank.jp/), and the KNAPSAcK (http://kanaya.naist.jp/KNApSAcK/) database [50]. The characterization of metabolites was based on MRM scans by checking the five parameters DP, CE, RT, Q1, and Q3 of the detected sample substances with database data [49]. The quantification of metabolites involved first integrating and correcting the mass spectral peak areas of all substances through MRM and then integrating and correcting the mass spectral peak areas of the same metabolite in separate samples [51]. Metabolites with variable importance for projection (VIP) \geq 1.0 and fold change \geq 2 or fold change \leq 0.5 were considered significantly different.

Statistical analysis

One-way analysis of variance (ANOVA) was used to test the differences among the means of variables and Duncan's multiple range test was used for post hoc pairwise comparison of different treatments. All the statistical analyses were performed using SAS software (version 9.4; SAS Institute, Cary, NC, USA). Shen et al. BMC Genomics (2022) 23:670 Page 16 of 17

Conclusions

In this study, an integrated analysis of transcriptome, metabolome, and physiological index data revealed an ABA regulation mechanism of two wild Fragaria species in response to cold stress. Under low temperature stress, wild strawberry may increase the accumulation of ABA by regulating the expression of ABA biosynthetic and metabolic pathway genes. After that, ABA may regulate the level of expression of amino acid metabolism and sucrose metabolism pathway genes by regulating GBF1 and other transcription factors to significantly increase the content of glucose and fructose and increase the activity of ROS scavenging enzymes, including POD, thereby reducing the damage caused by low temperature stress. The expression of ABF2 may be related to the glucose signal transduction ability of wild strawberry under low temperature stress. Under low temperature stress, the differences in the accumulation of ABA and the trends of expression of ABF2 and ABF4 in different species of wild strawberries may be the primary reason for their differences in cold tolerance.

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12864-022-08889-8.

Additional file 1: Fig. S1. Determination of the soft threshold.

Additional file 2: Fig. S2. GO enrichment analysis of ABA and REC related modular genes. ABA, abscisic acid; GO, gene ontology; REC, relative electrical conductivity.

Additional file 3: Fig. S3. KEGG enrichment analysis of modular genes. (a) Modular genes related to ABA and REC. (b) Modular genes related to POD and MDA. ABA, abscisic acid; KEGG, Kyoto Encyclopedia of Genes and Genomes; MDA, malondialdehyde; POD, peroxidase; REC, relative electrical conductivity.

Additional file 4: Fig. S4. KEGG functional annotation of ABA and REC related module genes. ABA, abscisic acid; KEGG, Kyoto Encyclopedia of Genes and Genomes; REC, relative electrical conductivity.

Additional file 5: Table S1. The cold tolerance ability of five *Fragaria* species.

Additional file 6: Table S2. Primers used for qRT-PCR.

Additional file 7: Table S3. The VIP and fold change value of the contents amino acids and intermediate metabolites in their metabolic pathways in leaves of *F. vesca* and *F. daltoniana* under cold stress. VIP, variable importance in projection

Additional file 8: Table S4. The VIP and fold change value of the sugar content in leaves of *F. vesca* and *F. daltoniana* under cold stress. VIP, variable importance in projection.

Acknowledgments

We thank the KEGG copyright permission for these images cited by us and obtained from KEGG in https://www.kegg.jp/kegg/kegg1.html.

Authors' contributions

Jincheng Shen: Formal analysis, Data curation, Software, Writing - original draft, Methodology, Investigation. Jie Liu, Yongge Yuan, Luxi Chen, Junxia Ma, Xin Li: Formal analysis, Data curation, Software. Junmin Li: Conceptualization,

Writing - review & editing, Supervision, Project administration, Funding acquisition. The author(s) read and approved the final manuscript.

Funding

This work was financially supported by the Ten Thousand Talent Program of Zhejiang Province (2019R52043), the National Natural Science Foundation of China (No. 31261120580), and the China Scholarship Council (CSC, 202108330041).

Availability of data and materials

All raw data have been submitted to the National Center for Biotechnology Information (NCBI) database (under the BioProject accession number PRINA803876).

Declarations

Ethics approval and consent to participate

All methods were carried out in accordance with relevant guidelines and regulations.

Consent for publication

Not applicable.

Competing interests

Authors declare that there are no competing interests.

Author details

¹Zhejiang Provincial Key Laboratory of Plant Evolutionary Ecology and Conservation, Taizhou University, Taizhou 318000, China. ²College of Life Science and Medicine, Zhejiang Sci-Tech University, Hangzhou 310018, China. ³Department of Plant and Environmental Sciences, University of Copenhagen, 1871 Frederiksberg C, Denmark.

Received: 16 May 2022 Accepted: 12 September 2022 Published online: 26 September 2022

Reference

- Cai H, Tian S, Liu C, Dong H. Identification of a MYB3R gene involved in drought, salt and cold stress in wheat (Triticum aestivum L.). Gene. 2011;485(2):146–52.
- Thakur P, Kumar S, Malik JA, Berger JD, Nayyar H. Cold stress effects on reproductive development in grain crops: an overview. Environ Exp Bot. 2010;67(3):429–43.
- 3. Joshi R, Singh B, Chinnusamy V. Genetically engineering cold stresstolerant crops: approaches and challenges: physiological, molecular and genetic perspectives. Cold Tolerance Plants. 2018;10:179–95.
- Yadav SK. Agronomy for sustainable development. Agron Sustain Dev. 2010;30:515–27.
- Skender A, Ajdinovic T, Becirspahic D. The comparison of phenotypic characteristics of current varieties and wild species of *Fragaria*. Genetika. 2015;47(1):45–52.
- Rohloff J, Kopka J, Erban A, Winge P, Wilson RC, Bones AM, et al. Metabolite profiling reveals novel multi-level cold responses in the diploid model Fragaria vesca (woodland strawberry). Phytochemistry. 2012;77:99–109.
- Lei J, Xue L, Guo R, Dai H. The Fragaria species native to China and their geographical distribution. Acta Hortic. 2017;1156:37–46.
- Yuan P, Yang T, Poovaiah BW. Calcium signaling-mediated plant response to cold stress. Int J Mol Sci. 2018;19(12):3896.
- Gong Z, Xiong L, Shi H, Yang S, Herrera-Estrella LR, Xu G, et al. Plant abiotic stress response and nutrient use efficiency. Sci China Life Sci. 2020;63(5):635–74.
- Babita M, Maheswari M, Rao L, Shanker AK, Rao DG. Osmotic adjustment, drought tolerance and yield in castor (*Ricinus communis* L.) hybrids. Environ Exp Bot. 2010;69(3):243–9.
- Silva-Ortega CO, Ochoa-Alfaro AE, Reyes-Agüero JA, Aguado-Santacruz GA, Jiménez-Bremont JF. Salt stress increases the expression of *P5CS* gene and induces proline accumulation in cactus pear. Plant Physiol Biochem. 2008;46(1):82–92.

Shen et al. BMC Genomics (2022) 23:670 Page 17 of 17

- Gang S, Liu Y, Lu T, Qi M, Guan X, Liu Y, et al. The effects of abscisic acid on photosynthesis in tomato under sub-high temperature and high light stress. J Comput Theor Nanos. 2016;13(10):7189–98.
- 13. Vierling E. The roles of heat shock proteins in plants. Annu Rev Plant Phys. 1991;42(1):579–620.
- Chen X, Zhao M, Pang F, Wang J. De novo assembly and transcriptome analysis of cultivated strawberry (*Fragaria* x ananassa) receptacles under freezing stress. Int J Agric Biol. 2018;20(7):1505–12.
- Koehler G, Wilson RC, Goodpaster JV, Sønsteby A, Lai X, Witzmann FA, et al. Proteomic study of low-temperature responses in strawberry cultivars (*Fragaria* × *ananassa*) that differ in cold tolerance. Plant Physiol. 2012;159(4):1787–805.
- Lu Q, Liu J, Chen L, Yang D, Shen J, Li J, et al. ABA-regulated ploidyrelated genes and non-structural carbon accumulation may underlie cold tolerance in tetraploid *Fragaria moupinensis*. Environ Exp Bot. 2020;179:104232.
- Thakur P, Nayyar H. Facing the cold stress by plants in the changing environment: sensing, signaling, and defending mechanisms. New York: Springer; 2013. p. 29–69.
- Ding Y, Shi Y, Yang S. Advances and challenges in uncovering cold tolerance regulatory mechanisms in plants. New Phytol. 2019;222(4):1690–704.
- Verslues PE, Zhu JK. Before and beyond ABA: upstream sensing and internal signals that determine ABA accumulation and response under abiotic stress. Biochem Soc T. 2005;33(2):375–9.
- Pospíšilová J, Synková H, Haisel D, Baťková P. Effect of abscisic acid on photosynthetic parameters during ex vitro transfer of micropropagated tobacco plantlets. Bio Plantarum. 2009;53(1):11–20.
- Taïbi K, Del Campo AD, Vilagrosa A, Bellés JM, López-Gresa MP, López-Nicolás JM, et al. Distinctive physiological and molecular responses to cold stress among cold-tolerant and cold-sensitive Pinus halepensis seed sources. BMC Plant Biol. 2018;18(1):236.
- Jin J, Zhang H, Zhang J, Liu P, Chen X, Li Z, et al. Integrated transcriptomics and metabolomics analysis to characterize cold stress responses in Nicotiana tabacum. BMC Genomics. 2017;18(1):496.
- Niu Y, Liu Z, He H, Han X, Qi Z, Yang Y. Gene expression and metabolic changes of Momordica charantia L. seedlings in response to low temperature stress. PLoS One. 2020;15(5):e0233130.
- 24. Galili G, Amir R, Fernie AR. The regulation of essential amino acid synthesis and accumulation in plants. Annu Rev of Plant Biol. 2016;67:153–78.
- 25. Hildebrandt TM, Nesi AN, Araújo WL, Braun HP. Amino acid catabolism in plants. Mol Plant. 2015;8(11):1563–79.
- 26. Rendina G, Singer TP. Solubilization and assay of choline dehydrogenase. Biochim Biophys Acta. 1958;30(2):441–2.
- 27. Quan R, Shang M, Zhang H, Zhao Y, Zhang J. Improved chilling tolerance by transformation with *betA* gene for the enhancement of glycinebetaine synthesis in maize. Plant Sci. 2004;166(1):141–9.
- 28. Milosavljević A, Prokić L, Marjanović M, Stikić R, Sabovljević A. The effects of drought on the expression of *TAO1*, *NCED* and *ElL1* genes and ABA content in tomato wild-type and flacca mutant. Arch Biol Sci. 2012;64(1):297–306.
- Okamoto M, Kushiro T, Jikumaru Y, Abrams SR, Kamiya Y, Seki M, et al. ABA 9'-hydroxylation is catalyzed by CYP707A in *Arabidopsis*. Phytochemistry. 2011;72(8):717–22.
- Danquah A, de Zelicourt A, Colcombet J, Hirt H. The role of ABA and MAPK signaling pathways in plant abiotic stress responses. Biotechnol Adv. 2014;32(1):40–52.
- 31. Fujita Y, Yoshida T, Shinozaki KY. Pivotal role of the AREB/ABF-SnRK2 pathway in ABRE-mediated transcription in response to osmotic stress in plants. Physiol Plantarum. 2013;147(1):15–27.
- 32. Kim S, Kang JY, Cho Dl, Park JH, Kim SY. ABF2, an ABRE-binding bZIP factor, is an essential component of glucose signaling and its overexpression affects multiple stress tolerance. Plant J. 2004;40(1):75–87.
- 33. Vanjildorj E, Bae TW, Riu KZ, Kim SY, Lee HY. Overexpression of *Arabidopsis ABF3* gene enhances tolerance to droughtand cold in transgenic lettuce (*Lactuca sativa*). Plant Cell Tiss Org. 2005;83(1):41–50.
- 34. Sato H, Suzuki T, Takahashi F, Shinozaki K, Yamaguchi-Shinozaki K. NF-YB2 and NF-YB3 have functionally diverged and differentially induce drought and heat stress-specific genes. Plant Physiol. 2019;180(3):1677–90.

- Achard P, Renou J, Berthome R, Harberd NP, Genschik P. Plant DELLAs restrain growth and promote survival of adversity by reducing the levels of reactive oxygen species. Curr Biol. 2008;18(9):656–60.
- 36. Sun Y, Xu W, Jia Y, Wang M, Xia G. The wheat *TaGBF1* gene is involved in the blue-light response and salt tolerance. Plant J. 2015;84(6):1219–30.
- Dong C, Ma Y, Xie R, Deng L, Yi S, Lü Q, et al. Expression of two citrus AP2/ERF genes under different hormone and stress treatments. Acta Hortic Sin. 2016;43(2):239–48.
- 38. Li L, Wang Z, Wang W, Wang HY, Ren MJ, Xu RH. Research advances of plant ABI5 transcription factors. J Shandong Agric Uni. 2019;50:537–41.
- 39. Xue L, Dai H, Lei J. Creating high polyploidy pink-flowered strawberries with improved cold tolerance. Euphytica. 2015;206(2):417–26.
- Fu Y, Li F, Xu T, Cai S, Chu W, Qiu H, et al. Bioaccumulation, subcellular, and molecular localization and damage to physiology and ultrastructure in *Nymphoides peltata* (Gmel.) O. Kuntze exposed to yttrium. Environ Sci Pollut R. 2014;21(4):2935–42.
- Chen X, Min D, Yasir TA, Hu YG. Evaluation of 14 morphological, yieldrelated and physiological traits as indicators of drought tolerance in Chinese winter bread wheat revealed by analysis of the membership function value of drought tolerance (MFVD). Field Crop Res. 2012;137:195–201
- 42. Chen F, Zhou W, Yin H, Luo X, Chen W, Liu X, et al. Shading in mother plant during seed development promotes subsequent seed germination in soybean. J Exp Bot. 2020;71(6):2072–84.
- Chen X, Jiang F, Jia C, Liu M, Nan Y, Qu L, et al. Comprehensive gene expression analysis in NMIBC using RNA-seq reveals new therapy strategies. Front Oncol. 2019;9:523.
- Kanehisa M, Goto S. KEGG: Kyoto encyclopedia of genes and genomes. Nucleic Acids Res. 2000;28(1):27–30.
- 45. Kanehisa M. Toward understanding the origin and evolution of cellular organisms. Protein Sci. 2019;28(11):1947–51.
- Kanehisa M, Furumichi M, Sato Y, Ishiguro-Watanabe M, Tanabe M. KEGG: integrating viruses and cellular organisms. Nucleic Acids Res. 2021;49(1):545–51.
- 47. Jin J, Tian F, Yang DC, Meng YQ, Kong L, Luo J, et al. PlantTFDB 4.0: toward a central hub for transcription factors and regulatory interactions in plants. Nucleic Acids Res. 2017;45:1040–5.
- 48. Cho K, Cho KS, Sohn HB, Ha IJ, Hong SY, Lee H, et al. Network analysis of the metabolome and transcriptome reveals novel regulation of potato pigmentation. J Exp Bot. 2016;67(5):1519–33.
- Chen W, Gong L, Guo Z, Wang W, Zhang H, Liu X, et al. A novel integrated method for large-scale detection, identification, and quantification of widely targeted metabolites: application in the study of rice metabolomics. Mol Plant. 2013;6(6):1769–80.
- Wishart DS, Jewison T, Guo AC, Wilson M, Knox C, Liu Y, et al. HMDB 3.0—the human metabolome database in 2013. Nucleic Acids Res. 2012;41(1):801–7.
- Fraga CG, Clowers BH, Moore RJ, Zink EM, BHCR F. Signature-discovery approach for sample matching of a nerve-agent precursor using liquid chromatography-mass spectrometry, XCMS, and chemometrics. Anal Chem. 2010;82(10):4165–73.

Publisher's Note

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.