ORIGINAL ARTICLE

Transcriptomics analysis reveals *Xanthoceras sorbifolia* **Bunge leaves' adaptation strategy to low nitrogen**

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Received: 3 August 2022 / Accepted: 24 April 2023 / Published online: 22 June 2023 © The Author(s), under exclusive licence to Springer-Verlag GmbH Germany, part of Springer Nature 2023

Abstract

Key message **This study enriched the understanding of the mechanism of nitrogen tolerance and starvation of yellowhorn and provided a reference for the breeding of low-nitrogen tolerance germplasm in the future.**

Abstract Yellowhorn is a rare woody oil crop in China, which can survive in barren, drought, cold, and even saline-alkali environments. However, its growth and development can be seriously afected by low-nitrogen stress. A comprehensive understanding of its transcriptional regulation activities under low-nitrogen stress is expected to indicate the key molecular mechanisms of its tolerance to low nitrogen levels. In this study, yellowhorn was divided into control, low-nitrogen, and nitrogen-free groups for treatment. Samples were treated for 15 days before assessing physiological characteristics and transcriptome analysis. Under low-nitrogen and no-nitrogen condition, a total of 10,733 diferentially expressed genes were identifed, among which 3870 genes were up-regulated and 6,863 genes were down-regulated. Under low-nitrogen stress, the most up-regulated genes were enriched in the phenylpropane synthesis pathway, favonoid synthesis pathway, and plant hormone signal transduction pathway. Our determination of total favonoids and proanthocyanidins also verifed the upregulation of these three pathways. Brassinosteroid, salicylic, and jasmonic acid (BR, SA and JA, respectively) pathwayrelated genes were signifcantly up-regulated in the signal transduction pathway of plant hormones. This study provided a comprehensive review of the transcriptomics changes of yellowhorn under low nitrogen stress and detailed its insights into the relevant mechanism of BR, SA, and JA signaling pathway in resisting low-nitrogen stress, laying a solid foundation to further identify the corresponding molecular mechanism of yellowhorn and other woody oil plants.

Keywords Transcriptome sequencing · Low nitrogen stress · Flavonoids · Proanthocyanidins · Brassinosteroid · Salicylic · Jasmonic acid

Abbreviations

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Introduction

Yellowhorn (Xanthocera sorbifolia Bunge) is a unique woody oil tree species in China, belonging to Sapindaceae, and widely distributed in most areas of northern China (Liu et al. [2014\)](#page-11-0). It has high economic value, e.g., the seeds are rich in oil (55–70%), unsaturated fatty acids account for 85–93%, with high antioxidant activity and nutritional value (Zhang et al. [2010](#page-13-0), Ruan et al. [2016](#page-12-0)). In addition, yellowhorn has extremely high ecological value, being different from most energy tree species that can only survive on farmland. Owing to its powerful root system and strong environmental adaptability, yellowhorn can survive in barren, drought, cold, and even saline-alkali environments (Guo et al. [2013;](#page-11-1) Liu et al. [2013](#page-11-2); Jin et al. [2020](#page-11-3)). Thus, it has attracted much attention in recent years. The Chinese government is also extremely concerned about such excellent tree species, and launched the yellowhorn Breeding Program as a "green environmental solution" to alleviate the energy crisis (Ebert Sustainability [2014](#page-11-4)), also promoting yellowhorn planting in desert, semi-arid, and arid areas as an efective measure to restore vegetation and prevent soil erosion, such as the demonstration base of one million mu of yellowhorn energy forest in Maigaiti county (Yao et al. [2013\)](#page-13-1). When planted on barren land, yellowhorn susceptibility to various abiotic stresses increases, which afects their growth and development.

Yellowhorn would not only be subjected to environmental stresses such as drought, low temperature, heat, and salinealkali (Jin et al. [2020;](#page-11-3) Lang et al. [2020](#page-11-5)), but also may be stressed by nutrient scarcity such as that of nitrogen. Nitrogen (N) is an important mineral element necessary for plant life, and the main nutrient and component of several macromolecules and signaling compounds (such as nucleic acids, proteins, and hormones) (Lin et al. [2011;](#page-11-6) Krapp [2015\)](#page-11-7). It afects several aspects of plant growth and development, such as N and C distribution, root branching, leaf growth, and fowering time (Bi et al. [2007](#page-10-0); Zhu et al. [2021\)](#page-13-2). In plants, Inorganic N uptake occurs mainly through nitrate and ammonium transporters, which transform nitrate and ammonium N absorbed by roots into amino acids that are subsequently transported to leaves (Wang et al. [2012;](#page-12-1) Yang et al. [2019](#page-13-3); Luo et al. [2015](#page-11-8); Black et al. [2002](#page-10-1)). Although plants absorb N mainly from the soil, soil N is usually limited, especially in barren areas with extremely low available N concentration, such as deserts and other places (Liu et al. [2020\)](#page-11-9). Therefore, lack of nitrogen will seriously limit the growth and development of plants (Chen et al. [2008\)](#page-11-10). N defciency leads to a decrease in plant growth rate, makes plant leaves yellow, and eventually reduces leaf size and photosynthetic rate (Nunes-Nesi et al. [2010](#page-12-2); Babst et al. [2019\)](#page-10-2). In addition, several studies emphasize that the effective N concentration in the soil afects the ability of plants to respond to biological stress (Ballini et al. [2013](#page-10-3)). Thus, yellowhorn grown in barren areas such as deserts may face a variety of abiotic stresses, making necessary to analyze the molecular mechanism of yellowhorn under low-N stress.

Currently, yellowhorn research mainly focuses on growth (Yao et al. [2009\)](#page-13-4), cultivation management, oil composition and extraction (Shen et al. [2019\)](#page-12-3), and conventional breeding (Liu et al. [2014](#page-11-0)). Transcriptomic studies have been conducted to shed light on diferent aspects of yellowhorn biology (Liu et al. [2013;](#page-11-2) Wang et al. [2018](#page-12-4)). The recent release of its whole genome sequence (Quanxin et al. 2019, Qiang et al. 2019)

should help investigate the underlying molecular mechanisms. So far, several transcriptome studies have been carried out on yellowhorn, e.g., Liu used the buds, leaves, fowers, and seeds of yellowhorn for transcriptome analysis, and then studied and identifed the genes related to yellowhorn oil accumulation (Liu et al. [2013](#page-11-2)). Furthermore, Li sequenced the transcriptome of seeds with diferent oil content, and found that the seeds with high oil content were mainly consequence of fatty acid biosynthesis and carbon supply increase (Li et al. [2020\)](#page-11-11). However, there are few studies on the molecular mechanisms related to abiotic stress in yellowhorn. At present, only Jin et al. have studied transcriptome sequencing of yellowhorn seedlings treated with NaCl, ABA and low temperature, and the results indicate that yellowhorn may form a specifc molecular defense system against a variety of abiotic stresses (Jin et al. [2020\)](#page-11-3). So far, there is no relevant report on the molecular defense mechanism of yellowhorn under low-nitrogen stress.

RNA-Seq is a widely used tool for studying molecular regulation mechanisms and fnding stress response genes (Que et al. [2014;](#page-12-5) Yang et al. [2018a](#page-13-5), [b\)](#page-13-6), and has been used on several plants to explore the molecular mechanism under low-N stress (Lu et al. [2019;](#page-11-12) Liu et al. [2020](#page-11-9)). Quan et al. revealed the molecular mechanism of two kinds of Tibetan wild barley under slow N defciency, and identifed candidate genes related to low-N tolerance (Quan et al. [2019\)](#page-12-6). Sugarcane is one of the most important cash crops worldwide, and its regulation and metabolic pathways under low-N conditions have also been preliminarily revealed (Yang et al. [2019](#page-13-3)) Yang et al. used transcriptomics to reveal changes in secondary metabolite (flavonoids and cafeine, among others) synthesis pathways in tea under low-nitrogen conditions (Yang et al. [2018a](#page-13-5), [b\)](#page-13-6). Liang's results indicated that anthocyanins, the secondary metabolites accumulated in Arabidopsis under low-nitrogen stress, contribute to its resistance to low-N stress (Liang and He [2018\)](#page-11-13). Meanwhile, Wu et al. showed that jasmonic acid (JA) signaling would mediate large-scale systemic changes in nitrogen uptake and distribution in rice (Wu et al. [2018\)](#page-12-7). In conclusion, plants have certain similarities in resistance to low-nitrogen stress, but each plant also has its own unique mechanism of lownitrogen tolerance, so it is necessary to study the mechanism of low nitrogen tolerance in yellowhorn.

In seed plants, the seedling stage is the most fragile in the life cycle (Jin et al. [2020\)](#page-11-3), and seedling traits phenotyping would be a helpful strategy for pre-selection of plants with strong adaptability to the feld stresses (Avramova et al. 2016). Therefore, to fll the knowledge gap regarding yellowhorn molecular defense mechanisms under low-N stress, we used RNA-Seq technology to sequence the transcriptome of yellowhorn seedlings under diferent N stress conditions.

Methods

Experimental design

Yellowhorn seeds were soaked in water at 50 °C for 3 days. Then, seeds were wrapped with cotton cloth soaked in water to keep them moist until they germinated. Germinated seeds were planted in sand and grown under a 16-h/8-h light cycle, 60% humidity, and 28 °C supplemented with 1/2 Hoagland solution every other day.

The experiment is as follows: yellowhorn which grows for 2 months and is similar in size, is divided into three groups and treated with three diferent concentrations of nutrient solution. The nutrient solution was 945 mg/l calcium sulfate, 506 mg/l potassium sulfate, 80 mg/l ammonium nitrate, 136 mg/l dipotassium hydrogen phosphate, 493 mg/l magnesium sulfate, 5.56 g/l ferrous sulfate heptahydrate, 7.46 g/l EDTA, 0.83 mg/l potassium iodide, 6.2 mg/l boric acid, 22.3 mg/l manganese sulfate, 8.6 mg/l zinc sulfate, 0.25 mg/l sodium molybdate, 0.025 mg/l copper sulfate, and 0.025 mg/l cobalt chloride. Ammonium nitrate was used as the sole N source, at 0, 16, and 160 mg/l (NN, LN, and CK, respectively) (The general standard of cultivated soil is that the nitrogen concentration is 150–200 mg/Kg.). During 15 days, water plants with 400 ml of nutrient solution every three days.

Physiological index determination and phenotype observation

After 15 days of treatment, stressed (LN, NN) and control (CK) seedlings were collected for the following measurements, which were performed with three independent biological replicates if not otherwise specifed:

Relative plant fresh weight determination and phenotypic observation: The average fresh weights and plant height, root length, and lateral root length of seedling in LN, NN and CK groups were measured calculated using three randomly chosen seedlings as independent biological replicates for each group.

Flavonoids and procyanidins: About 0.2 g of fresh yellowhorn leaves were added to 1 ml of 80% methanol, ground thoroughly, and leached overnight. Then, the sample was centrifuged at $8000 \times g$ for 10 min, and the supernatant was collected. Blow the supernatant N to the water phase, 1 ml petroleum ether was added into the water phase, fully shaken, let stand for layering, and the upper petroleum ether phase was discarded. After adjusting the pH to $2.5-3.0$ with about 20μ l 2 M HCl solution, it was extracted twice with 1 ml of ethyl acetate, the ethyl acetate phases combined, and the ethyl acetate phase N was

blown to dryness. Then, 1.5 ml PBS bufer was added to redissolve, and measurements were made after membrane fltration. Flavonoids and proanthocyanidins were determined using favonoid and proanthocyanidin kits (Nanjing Jiancheng Institute of Bioengineering).

Determination of plant hormone content: Brassinolide (BIO(Tw)-E07(Pl)-00016, Shanghai Tongwei reagent), jasmonic acid (Ml077234, Shanghai Institute of Enzyme-Linked Biology), abscisic acid (Ml077235, Shanghai Institute of Enzyme-linked Biology) and salicylic acid (Ml077224, Shanghai Institute of Enzyme-linked Biology) were determined by enzyme-linked immunosorbent assay (Sharipova et al. [2016\)](#page-12-8).

Determination of soluble protein content: We used the method described by Bradford (Coomassie brilliant blue staining) to determine the content of soluble protein with bovine serum albumin as the standard (Bradford [1976](#page-10-4)).

Determination of chlorophyll content: The chlorophyll content is determined by spectrophotometry (Costache M A. [2012\)](#page-11-14).

Sample collection and RNA extraction

RNA samples were prepared from 9 yellowhorn leaf samples (3 treatments \times 3 biological replicates) (The leaves of yellowhorn are pinnate compound leaves). The second compound leaves of seedlings were collected at each time point, which were frozen in liquid nitrogen and stored in a refrigerator at − 80 °C for further analysis. The top tender leaves of yellowhorn were selected, frozen in liquid N, and stored at -80 °C. According to the manufacturer's instructions, total RNA was extracted using a total RNA extractor (Trizol) kit (B511311, Chinese laborers) and treated with DNase I without RNase to remove genomic DNA contamination. RNA integrity was evaluated with 1.0% agarose gel. Then, RNA quality and quantity were evaluated using spectrophotometer (IMPLEN, CA, USA) and Agilent 2100 bioanalyzer (Agilent Technologies, CA, USA). The transcriptional group was sequenced using the method described by Wang et al. (Wang et al [2016](#page-12-9)). In short, mRNA was purifed from total RNA using poly-T oligo-attached magnetic beads. Fragmentation was carried out using divalent cations under elevated temperature in NEB Next First Strand Synthesis Reaction Bufer (5X). First strand cDNA was synthesized using random hexamer primer and M-MuLV Reverse Transcriptase. Second-strand cDNA synthesis was subsequently performed using DNA Polymerase I and RNase H. Remaining overhangs were converted into blunt ends via exonuclease/polymerase activities. After adenylation of 3' ends of DNA fragments, NEB Next Adaptor with hairpin loop structure were ligated to prepare for hybridization. To select cDNA fragments of preferentially 240 bp in length, the library

fragments were purifed with AMPure XP system (Beckman Coulter, Beverly, USA). Then, 3 μl USER Enzyme (NEB, USA) was used with size-selected, adaptor-ligated cDNA at 37 °C for 15 min followed by 5 min at 95 °C before PCR. Then PCR was performed with Phusion High-Fidelity DNA polymerase, Universal PCR primers and Index (X) Primer. At last, the purifed PCR product was quantifed using the Agilent Bioanalyzer 2100 system. After cluster generation, the fnal cDNA library was sequenced on Illumina HiSeq platform.

Diferential expression analysis

DESeq2 (version 1.12.4) was used to determine the diferentially expressed genes (DEGs) between two samples. If q -Value < 0.001 and \vert FoldChange \vert > 2, the gene was considered to be signifcantly diferentially expressed. When the normalized expression of the gene was zero between the two samples, its expression value was adjusted to 0.01 because 0 cannot be plotted on the logarithmic graph. If the normalized expression of a certain gene in both libraries was less than 1, it was excluded from further diferential expression analysis.

Functional analysis of diferentially expressed genes

The unigene sequence assembled and screened was compared with Nr, Nt, Swiss-Prot, GO, KEGG, and other databases by BLAST, and the comparison results with Nr, Nt, Swiss-Prot and the functional annotation of GO, and KEGG pathway were obtained with *E*-value<10 as threshold. In addition, Pfam was searched by Hmmscan to obtain unigenes' functional domain and protein family annotation information. Functional enrichment analyses included Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) to determine which DEG was signifcantly enriched in GO or metabolic pathways. GO is an international standard classification system for gene function, while KEGG is a public database of metabolic pathway data. KEGG pathway analysis can identify signifcantly abundant metabolic pathways or signal transduction pathways in DEG. With a P -value ≤ 0.05 , GO items and KEGG pathway were considered to have signifcant changes.

Quantitative reverse transcription PCR verifcation

To verify the accuracy of RNA-Seq sequencing, eight DEGs were randomly selected for quantitative reverse transcription PCR (qRT-PCR) verifcation. Real-time quantitative PCR was performed using One Step RT-qPCR Kit (B639277, Chinese GENERATORS) according to the manufacturer's instructions. The EF-1 α gene was used as reference gene and gene-specifc primers of the selected DEGs were designed using PRIMER5 (Table S7). qRT-PCRs were performed on an ABI Step One plus platform with three reactions for each biological replicate and a total of three biological replicates for each gene.

Results

Efects of nitrogen stress on yellowhorn growth and development

The growth status of yellowhorn under diferent N conditions was evaluated to assess its growth change under N defciency. After 15 days of treatment, compared to those in CK, yellowhorn plant height decreased by 5.7 and 14.66% after LN and NN treatment (Table [1\)](#page-3-0), respectively, and fresh weight also decreased by 4.38 and 14.93%, respectively. Contrastingly, yellowhorn root growth and development under N deficiency was stronger than those in CK (Table [1\)](#page-3-0) (Fig. S1). Root length was 21.86% and 38.89% higher than that of CK under LN and NN treatments, respectively, and the number of lateral roots also signifcantly increased by 52.36 and 50.07%, respectively, compared to that of CK. The root development of yellowhorn may be caused by low-N stress. In this experiment, the soluble protein content of yellowhorn increased after treatment. Compared with CK, the soluble protein of yellowhorn increased by 11.32 and 38.69% after LN and NN treatments, respectively (Table [1](#page-3-0)), indicating that LN and NN treatments afected the Soluble protein content of plants. Under LN treatment, the contents of chlorophyll a, chlorophyll b and total chlorophyll

Table 1 Biomass Changes of yellowhorn under Diferent Treatments

Treatment	plant height (Cen- timeters)	fresh weight (g)	Root length (Cen- timeters)	Number of lateral roots (Root)	Soluble protein (mg/L)	Chlorophyll a(mg/g)	Chlorophyll b(mg/g)	Total chlorophyll (mg/g)
СK	$19.30 + 0.84$	$7.30 + 0.42$	$11.16 + 0.35$	20.13 ± 1.37	$61.56 + 0.06$	2.533 ± 0.11	$4.40 + 0.10$	5.29 ± 0.19
LN	$18.20 + 1.06*$	$6.98 + 0.21*$	$13.60 + 0.94*$	$30.67 + 0.66$ **	$68.53 + 0.18*$	$1.828 + 0.12*$	$3.058 \pm 0.03*$	$4.06 \pm 0.08*$
NN.	$16.47 + 0.91**$	$6.21 + 0.94*$	$15.50 + 0.40**$	$30.21 + 1.25**$	$85.76 + 0.62*$	$1.399 + 0.07**$	$2.789 + 0.05**$	$3.26 \pm 0.07**$

Data are presented as the means \pm standard error

Asterisk indicates statistically signifcant diferent (*P*<0.05)

decreased by 27.83%, 30.5% and 23.38% respectively. Under NN treatment, the contents of chlorophyll a, chlorophyll b and total chlorophyll decreased by 44.77%, 36.61% and 38.33%, respectively. (Table [1\)](#page-3-0). In a word, these results show that low nitrogen and nitrogen deficiency stress have affected the growth and development of yellowhorn.

Illumina sequencing and de novo transcriptome assembly

On the 15th day after treatment, an appropriate amount of yellowhorn leaves were obtained under CK, LN, and NN conditions to reveal the molecular mechanism of yellowhorn response to long-term low-N stress. The RNA integrity number (RIN) of all components is greater than 7.5 (Table [2](#page-4-0)). Illumina HiSeq™ 2000 was used to sequence yellowhorn seedlings treated with three N concentrations, and nine transcriptome libraries were constructed. After removing lowquality readings, 74.27 Gb clean data were obtained, with clean data reaching 6.86 Gb for each sample and Q30 base percentage above 95.33%. A total of 242,816 unigenes were obtained, with lengths ranging from 200 to over 2000 bp. The average unigene length was 464.84 bp and the single gene splicing length (N50) was 545 bp (Table [3\)](#page-4-1). Clean data for each sample reached 5.90 Gb, and the percentage of Q30 bases was 97.36% or higher (Table S1), which indicated that sequencing data was suitable for gene expression analysis. Additionally, these data can greatly expand the transcriptome resources of yellowhorn in unknown gene mining, molecular genetics, functional genomics and other felds.

Functional annotation and classifcation

Annotation results: At least 205,824 single genes were annotated in each database, accounting for 84.77% of the total enriched single genes. A total of 187,617 unigenes (77.27%) were annotated in NT database. There were 127,305 (52.43%) and 105,875 (43.6%) unigenes annotated in GO and NR database, respectively. Moreover, 10,088 unigenes were annotated in KEGG database, which is frequently used in plants (Table S2). To study the sequence conservation between yellowhorn and other plant species, we analyzed

plants are color coded

the species distribution of single gene data set by comparing the sequence with the NR database. The species distribution corresponding to the sequence is shown in Fig. [1](#page-4-2). The number of sequences identical to Arabidopsis thaliana was large, reaching 29,531, with 8619 for Citrus sinensis, 5809 for Citrus clementina, 4334 for Phaseolus vulgaris and 2163 for Theobroma cacao.

The possible functions of unigene in yellowhorn leaves were classifed in the GO database. According to the homology comparison results, 127,305 unigenes were annotated in 71 functional groups in the GO database. Among them, a total of 22, 27, and 22 subgroups were annotated in the molecular function, biological process, and cellular component grouping, respectively. In the molecular functional grouping, the subgroups with a large number of unigenes were binding, catalytic activity, and transporter activity (78,134, 62,323, and 8716, respectively). Considering biological processes, there were 86,021, 72,740, and 64,337 unigenes in the cellular, metabolism, and single-organic processes subgroups, respectively, while for cell composition, cells, cell parts, and organelles (Figure S4) were the highest in unigene number (97,843, 97,698, and 73,472, respectively).

All unigenes were matched to 64,849 hits distributed in 25 functional groups in KOG databases (Figure S4). The three groups with the largest number of genes were signal transduction mechanism, general function prediction only, post-translation modifcation, protein turnover, and molecular modifcation (protein turn over, chaperones). As shown in Fig. [5](#page-7-0), 14,811 unigenes were annotated in 23 channels. Among them, translation, signal transduction, carbohydrate metabolism, and transport and metabolism had a high count of annotated genes (Figure S5).

Analysis of diferentially expressed genes under diferent nitrogen concentrations

Compared with CK, 2475 and 5636 unigenes in the LN group, and 2476 and 3007 unigenes in the NN group were up- and down-regulated, respectively (Fig. [2\)](#page-5-0). To identify active biological pathways enriched with DEGs in yellowhorn, the KEGG pathway database was searched. KEGG enrichment analysis results were shown in Figs. [3A](#page-6-0) and [4](#page-7-1)B, with the frst 20 top-ranking pathways indicated by the smallest signifcant Q values. Up-regulated genes were the most enriched in plant hormone signal transduction, favonoid biosynthesis, and phenylpropanoid biosynthesis. In addition, galactose metabolism, arginine, and proline metabolism, which are involved in regulating osmotic balance, and glutathione metabolism, which can produce and remove reactive oxygen species (ROS), were obviously enriched. In yellowhorn, most genes in these metabolic pathways were up-regulated with lack of N whether in LN or NN treatment group.

Yellowhorn genes and pathways related to low‑nitrogen response

To explore the low-N response mechanism in yellowhorn, we examined transcriptional changes of potential low-N response genes in LN and NN. We found that genes related to brassinosteroid (BR), JA, and salicylic acid (SA) signal transduction were signifcantly up-regulated (Tables S3 and S4). The contents of brassinosteroid (BR), jasmonic acid and salicylic acid (SA) in yellowhorn leaves under low-nitrogen stress were also signifcantly higher than those in the control group (Fig. [5](#page-7-0)). Additionally, phenylpropanoid biosynthesis

Fig. 2 Venn diagram of diferentially expressed genes regulated by nitrogen concentration, i.e., low-N (LN) and no N (NN) vs control (CK). **A** up-regulated genes; **B** down-regulated genes. DESeq2 (version 1.12.4) was used to determine the diferentially expressed

genes (DEGs) between two samples. If q -Value <0.001 and \vert Fold-Change $|>2$, the gene was considered to be significantly differentially expressed

Fig. 3 Bubble chart of upregulated KEGG genes in difer ent treatments. **A** low nitrogen vs. control; **B** no N vs. control. Color represents the qvalue value, and the size of bubbles represents the number of genes

Fig. 4 Analysis of plant hormone content under low nitrogen stress. **A** ABA content in leaves; **B** BR content in leaves; **C** SA content in leaves; **D** JA content in leaves. Perform three biological repetitions.

Fig. 5 Correlation between RNA-Seq expression profle and qRT-PCR results. Their relative expression levels were measured and calculated using EF -1 α -F as the internal reference gene. Three biological replicates were performed. The ratios were $log2$ transformed, >0 means down-regulated, and < 0 indicates up-regulated

was also signifcantly enriched. As a downstream metabolic pathway of phenylpropanoid biosynthesis, its accumulation was also apparent. Moreover, 33 and 32 DEGs were identifed as reactive oxygen scavenging genes (Tables S5 and

The data were analyzed by one-way ANOVA. The diferent representations of lowercase letters have statistical significance $(P<0.05)$

S6), belonging to glutathione metabolism, and 47 and 33 osmotic potential regulation genes (Tables S5 and S6) were metabolized by arginine, proline, and galactose in LN and NN transcriptase, respectively. The number of related genes identifed in the NN transcriptome was signifcantly lower than that in the LN transcriptome.

Real‑time qPCR validation

To validate the transcriptome data sets, real-time qPCR technology was applied to analyze transcriptional levels of 8 randomly selected genes from transcriptome data sets. Their relative expression levels were measured and calculated using $EF-1\alpha-F$ as the internal reference gene. These eight genes included: *leucoanthocyanidin reductase-like*, *Basic helix–loop–helix DNA-binding family protein*, *anthocyanidin synthase*, *chalcone isomerase*, *hypothetical protein CICLE v10005200mg*, *NRT1*, *hypothetical protein CICLE_ v10032858mg* and *abscisic-aldehyde oxidase isoform X1*. RT-PCR results confrmed that the transcription changes of these 8 genes were comparable with the fold-changes observed in our transcriptome analysis (Fig. [5\)](#page-7-0).

Determination of brassinosteroid (BR), jasmonic acid and salicylic acid (SA) contents

Transcriptome data showed that the expression of many genes in plant hormone signal transduction pathway was upregulated in the condition of nitrogen defciency. The data showed that the contents of brassinosteroid, jasmonic acid and salicylic acid in the treatment group were signifcantly higher than those in the control group, although there were diferences in abscisic acid content, but the diferences were not signifcant. The levels of brassinosteroid in LN and NN groups were 14.48 ng/ml and 23.01 ng/ml, respectively. The jasmonic acid content in LN and NN groups was 115.79 and 193.83 ng/ml, respectively. The contents of salicylic acid in LN and NN groups were 148.83 and 220.1 ng/ml, respectively (Fig. [4\)](#page-7-1).

Determination of total favonoids and procyanidins

Transcriptome data showed that yellowhorn was active in flavonoid synthesis pathway under N deficiency, and most genes were up-regulated. Data showed that total favonoid and proanthocyanidin contents in the LN treatment group were signifcantly higher than those in CK, but those in the NN treatment group were lower than those in CK. The total flavonoid content in the LN group was 4.62 mg/g, while that in NN was only 1.32 mg/g. The content of proanthocyanidins was 0.98 and 0.11 mg/g in the LN and NN group, respectively (Fig. [6\)](#page-8-0).

Discussion

N is an important essential macronutrients for plants, and its lack in soil will inhibit crop growth (Ologundudu and Adelusi [2013](#page-12-10)). Nitrates, ammonium, and various amino acids can be used and absorbed from the soil by plant roots (Xuan et al. [2017;](#page-12-11) Rentsch et al. [2007](#page-12-12); Wang et al. [2020a,](#page-12-13) [b](#page-12-14)). In this study, we controlled the concentrations of nitrate and ammonium in the soil, combined with transcriptome sequencing technology to analyze the mechanism of tolerance to low nitrogen. Compared with CK, single genes in LN and NN groups were down-regulated, suggesting that growth inhibition under nitrogen defciency was caused by the damage of several genes. Meanwhile, several up-regulated genes may play an important role in yellowhorn resistance to low-N stress.

In plant growth and resistance to abiotic stress, phenylpropane biosynthesis is an important pathway (Wang et al. [2011;](#page-12-15) Li et al. [2020\)](#page-11-11), with a powerful antioxidant efect, mainly because several antioxidants (simple or complex phenols) come from it (Dixon and Paiva [1995](#page-11-15)). Depending on the stress type, diferent phenolic compounds can be induced by up-regulating corresponding biosynthetic enzyme genes (Dixon and Paiva [1995\)](#page-11-15), with the phenylalanine pathway being important to promote the synthesis of plant secondary metabolites, e.g., phenylalanine ammonia lyase (PAL) converts phenylalanine into monohydric phenol and dihydric phenol, which are substrates of polyphenol oxidase (PPO) (Tomás-Barberan et al. [1997](#page-12-16)). In general, owing to stress caused by various abiotic factors (high temperature and cold, UV-B radiation, physical damage, among others), PAL activity increases and several phenols accumulate (Solecka and Kacperska [2003;](#page-12-17) Sgarbi et al. [2003\)](#page-12-18), e.g., PAL activity of barley seedlings increased phenolic substance accumulation under NaCl treatment (Wang et al. [2020a,](#page-12-13) [b](#page-12-14)), and the expression of PAL-related genes was increased and total phenol and favonoid synthesis was in maize under high temperature stress (Wu et al. [2020\)](#page-12-19). Additionally, PAL is one of the main indicators of environmental pressure in diferent plant tissues (Sánchez-Ballesta et al. [2000\)](#page-12-20). Numerous studies in wheat, rice, and maize have shown that nitrogen starvation can rapidly induce ROS outbreaks (Lian et al. [2006,](#page-11-16) Trevisan et al. [2012](#page-12-21), Hsieh et al. [2018](#page-11-17)). In this study, we found that eight genes related to propyl benzene metabolism were up-regulated in the experimental group, including *PAL* (Trinity _ DN 70437 _ C2 _ G6, Trinity _ DN 73556 _ C3 _ G1, TRINITY_DN74117_c0_g2), *cafeoyl-COA O-meth-*

yltransferase (TRINITY_DN73937_c1_g1), *8-hydroxygeraniol dehydrogenase-like* (TRINITY_DN73343_c1_g1),

Fig. 6 Contents of total favonoids and procyanidins under low-N (LN), N-free (NN), and control (CK) treatments. **A** Total favonoid content in leaves; **B** Proanthocyanidins content in leaves. Three biological replicates were performed. Asterisk indicates statistically signifcant diference (*P*<0.05)

 CK

 \blacksquare LN

 \mathbb{R} NN

∗

NN

LN

Treatment

cytochrome P450 (Trinity _ DN 73127 _ C1 _ G1), *cafeoylshikimate esterase* (Trinity _ DN 76482 _ C2 _ G1), and *aldehyde dehydrogenase family 2 member C4* (Trinity _ DN 66,962 _ C0 _ G1). These results indicate that phenylalanine metabolism may afect the synthesis of phenolic compounds under low-N conditions, participating in yellowhorn resistance to low-N stress under low-N conditions.

Plant growth mainly depends on primary metabolism, while plant defense especially depends on the synthesis of secondary metabolites, such as favonoids. Flavonoid is one of the main downstream branches of the phenylalanine pathway, which helps plants to resist stress (Li et al. [2020](#page-11-11)). Flavonoids have several functions in plants, e.g., ultraviolet (UV) damage protection agents and antitoxins of pathogens, reducing oxidative damage (Rajendran et al. [2014](#page-12-22)), among others, and their concentrations are usually increased owing to such factors, e.g., ultraviolet UV-B radiation promotes favonoid synthesis in ginkgo biloba leaves (Zhao et al. [2020](#page-13-7)). In plants, the main biosynthetic pathway of favonoids is shikimic acid pathway, which provides a common precursor for phenylalanine synthesis, and is not only used for amino acid and protein synthesis, but also for that of secondary metabolites (Taiz and Zeiger [2002](#page-12-23), Deng et al. [2019\)](#page-11-18). Moreover, several plants induce favonoid accumulation in the absence of N, e.g., Potamogeton amplifolius, Nuphar advena, and Arabidopsis (Cronin and Lodge [2003](#page-11-19); Lillo et al. [2008](#page-11-20)). CHS is a key enzyme in favonoid synthesis and can produce intermediates for the synthesis of all favonoids, and when CHS reactions are strongly constrained, the production of anthocyanin and nearly all other favonoids is efectively eliminated (Clark and Verwoerd [2011](#page-11-21)). In this study, we found that CHS expression was afected by the concentration of mineral elements, with *CHS* genes (Trinity _ Dn67486 _ C0 _ G3, Trinity _ Dn69687 _ C2 _ G18) being up-regulated in all treatments in the experiment. Meanwhile, the contents of total favonoids increased signifcantly in the LN group, while that in the NN group decreased signifcantly compared to that in CK. Therefore, it can be inferred that favonoids cannot be synthesized when N concentration is too low.

Anthocyanins, a branch of favonoids, have several biological functions in higher plants and are one of the most widely studied compounds (Tanaka et al. [2008;](#page-12-24) Qi et al. [2020](#page-12-25)). Anthocyanins not only provide colors to plants, but also reduce oxidative damage under biological or abiotic stress (Jaakola [2013\)](#page-11-22). Anthocyanin biosynthesis is also afected by external factors, such as light and low temperature, among others (Zhao et al. [2017](#page-13-8), Xie et al. [2018](#page-12-26)). Anthocyanin synthesis would probably be indicative of the reduction of photosynthetic capacity to balance the lack of N. Recent studies have found that low-N conditions also promote anthocyanin synthesis in plants (Deng et al. [2018](#page-11-23); Meng et al. 2020), and our results were consistent with previous fndings. And anthocyanin synthesis would probably be indicative of the reduction of photosynthetic capacity to balance the lack of N. We found that anthocyanin content was not consistent with the expression level of structural genes under NN treatment, i.e., the genes related to anthocyanin synthesis were up-regulated but the content of anthocyanin was lower than that of CK. Therefore, we hypothesized that the decrease of yellowhorn anthocyanin content in N-free condition was mainly caused by the defciency of its precursor, rather than by gene regulation.

In this study, glutathione, arginine, proline, and galactose metabolism were also enriched under hypo-N stress. Glutathione reductases are antioxidant enzymes that can efectively scavenge free radicals and protect plant organisms (Begara Morales et al. [2015](#page-10-5)). Proline is a protective osmotic-regulatory agent, and at high levels can reduce the water potential and enhance ROS removal by antioxidants as in peas and Stipa purpurea (Sánchez et al. [1998](#page-12-27); Yang et al. [2015\)](#page-12-28). In addition, the up-regulated expression of some genes in arginine metabolism was found in this study, and we believe that this situation may be a way to promote proline biosynthesis. Galactose, a soluble sugar, also plays an important role in the plant osmotic regulation, e.g., poplar can enhance the absorption of water by cells through the accumulation of soluble sugar (Jia et al. [2016\)](#page-11-25). Our results showed that glutathione, arginine and proline, and galactose metabolism were the molecular bases allowing yellowhorn to resist low-N stress.

Plant hormones play an important role in plant growth, development, and response to abiotic stress (Bogatek and Gniazdowska [2007;](#page-10-6) Verma et al. [2016](#page-12-29)). A large number of studies have shown that plant hormones are important components of nitrogen stress signal transduction (Sultana et al [2020](#page-12-30); Kiba et al. [2011\)](#page-11-26). Plants usually respond to external stimuli by activating signaling cascades which modify downstream gene expression patterns and fnally realize physiological and metabolic adaptations (Osakabe et al. [2014](#page-12-31)). Previous studies have found that plants may induce the synthesis of abscisic acid, auxin, gibberellin, ethylene and cyto-kinin when they are nitrogen deficient (Ma et al. [2020;](#page-11-27) Kang et al. [2019;](#page-11-28) Kiba et al. [2011](#page-11-26); Merchante et al. [2013\)](#page-11-29). These hormones, such as ethylene, GAs, ABA, and cytokinin, may be involved in the regulation of root growth and development through interactions with auxin (Hu et al. [2020;](#page-11-30) Kong et al. [2021](#page-11-31)). In this study, we found that the lower the N concentration, the more developed the root system of yellowhorn. Auxin, gibberellin, ethylene and cytokinin-related genes were not up-regulated in our study, and ABA signal transduction-related genes were only up-regulated in the absence of nitrogen, which was also confrmed by our determination of ABA content in plants. As BR is a major growthpromoting steroid hormone that regulates cell elongation and division and plays an important role in root growth and development (Belkhadir and Jaillais [2015;](#page-10-7) Vragovic et al. [2015\)](#page-12-32). Therefore, we believed that BR regulated root growth and development of yellowhorn under low-nitrogen stress, and we also confrmed the increase of BR content in plants. Ethylene is not only involved in resisting N hunger, but also plays an important role in anthocyanin synthesis induced by N deficiency (Zhao et al. [2015](#page-13-9)). In this study, ethylene was not induced under low-N stress, but the cytochrome P450 gene involved in its signal transduction pathway and genes related to proanthocyanidin synthesis were highly expressed (Tiwari et al. [2020](#page-12-33)). Moreover, we found that low N signifcantly induced JA signaling pathway and verifed that JA content increased in plants. Since cytochrome P450 is also involved in jasmonic acid signal transduction, we speculated that jasmonic acid may be involved in anthocyanin synthesis under low-nitrogen stress. Previous studies have shown that jasmonic acid and salicylic acid are also related to the response to low-nitrogen conditions (Lv et al. [2021,](#page-11-32) Sun et al. [2020\)](#page-12-34). JA signaling may function by regulating sugar biosynthesis, amino acid biosynthesis, and absorp-tion of NH4⁺ (Sun et al. [2020\)](#page-12-34). However, the activation of JA or SA-mediated defense responses usually comes at the expense of plant growth (Karasov et al [2017;](#page-11-33) Campos et al. [2016](#page-10-8)). Under low-nitrogen stress, compared to those in CK, yellowhorn plant height decreased by 5.7 and 14.66% after LN and NN treatment, respectively, and fresh weight also decreased by 4.38% and 14.93%, respectively. It also seems to confrm that SA and JA signals synergically mediate yellowhorn's resistance to low-nitrogen stress. Therefore, we believe that JA, SA, and BR constitute a highly complex coordinated signal transduction mechanism in yellowhorn.

Conclusion

In summary, we frst described yellowhorn physiological response to low-N stress. The transcriptome data sets of diferent yellowhorn genetic materials were obtained using RNA-Seq technology to explore key genes and metabolic pathways associated with low N. Our results indicated that JA, SA, and BR signaling are activated in yellowhorn under low-N stress. Up-regulated genes involved in the synthesis of phenylpropyl, favones, and anthocyanins, as well as some genes involved in galactose, arginine and proline, and glutathione metabolism were up-regulated to help yellowhorn fght N hunger. These results expand our understanding of the N-starvation resistance mechanism in yellowhorn and provide reference for the breeding of low-N tolerant germplasm in the future.

Author contribution statement XL, JZ, HJ, and CJ conceived the idea. XL, CJ, and JZ carried out the laboratory work. XL, and CJ performed the data analysis. XL wrote the

manuscript, and HJ completed the fnal revision. All authors have read and approved the fnal manuscript.

Supplementary Information The online version contains supplementary material available at<https://doi.org/10.1007/s00468-023-02414-4>.

Acknowledgements We thank Sangon Biotech (Shanghai) for helping with transcriptome sequencing.

Funding This work was financially supported by Science Technology Yuanjiang Project of Xinjiang Uygur Autonomous Region (2016E02045).

Data availability The original data are stored in NCBI database, with SRA registration number: PRJNA726832 and GEO registration number: GSE223332. [\(https://www.ncbi.nlm.nih.gov/sra/PRJNA726832](https://www.ncbi.nlm.nih.gov/sra/PRJNA726832)).

Declarations

Conflict of interest We declare that there is no confict of interest in this manuscript.

Ethics approval Not applicable.

Consent to participate Not applicable.

Consent for publication Not applicable.

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