RESEARCH ARTICLE

Comparative Analysis of miRNA Expression Profles Provides Insight into Regulation of Biosynthesis of Flavonoids and Terpenoids Between Two Varieties of *Toona sinensis* **Sprouts**

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Abstract

In this study, small RNA sequencing has been performed to identify the miRNAs and explore their regulatory mechanism in *T. sinensis* sprouts. From HPLC analysis, the favonoid content was higher in the BYC2 (purple toon sprout) than in the GYC2 (green toon sprout), whereas the volatile terpenoids revealed an inverse change. Therefore, the small RNA libraries of two varieties were constructed, and 331 known miRNAs and 23 novel miRNAs were discovered. Diferential gene expression analysis demonstrated the upregulation of 25 miRNAs and the downregulation of 27 miRNAs between BYC2 and GYC2. qRT-PCR analysis showed that nine miRNAs involved in the biosynthetic regulation of favonoids were downregulated in the BYC2, whereas eight miRNAs related to the regulation of the biosynthesis of terpenoids were upregulated, when compared with GYC2. The results indicated that the diferential expression of the miRNAs mentioned above played a crucial role in the regulation of the formation of the favonoids and terpenoids in *T. sinensis* sprouts. The present study not only flls in the paucity of knowledge regarding the *T. sinensis* miRNA, it also provides more valuable information for the genetic improvement of *T. sinensis* cultivation for the future.

Keywords Flavonoids · Terpenoids · miRNA · *T. sinensis* · High-throughput sequencing · Post-transcriptional regulation

Abbreviations

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Introduction

Toona sinensis (A. Juss) Roem, commonly called the Chinese toon, is a deciduous tree of Meliaceae and is widely distributed across Asia, including China, India, and North Korea (Edmonds and Staniforth [1998](#page-18-0)). The sprouts or the young shoots of the plant are very popular in vegetarian cuisine for their unique favor and high nutrition (Zhai and Granvogl [2019\)](#page-19-0). The consumption of toon sprouts as raw material, as toon tea or toon beef sauce is favored by con-sumers all over the world (Zhao et al. [2019](#page-19-1)). The seeds, roots, bark, and leaves too, have been well known over a long time for their oriental medicinal properties (Chen et al. [2019\)](#page-18-1). These characteristics in *T. sinensis* are induced by the presence of a large number of natural active compounds, such as polyphenols, favonoids and terpenoids, etc. (Shen et al. [2017](#page-19-2); Peng et al. [2019](#page-19-3)). Besides the nutritional value, the high concentration of secondary metabolites present in the toon sprouts showed the beneficial effects on human health, which increased the interest of the researchers to discover the details regarding the secondary metabolic pathways.

Since *T. sinensis* is a non-model plant and its genomic background still remains unknown, many of the reports available at present dealing with the secondary metabolic pathways of *T. sinensis* were based on the transcriptome sequencing analysis (Zhang et al. [2016;](#page-19-4) Sui et al. [2019](#page-19-5); Zhao et al. [2019\)](#page-19-1). In our earlier study, some dominant genes involved in the biosynthetic pathways of the favonoids were identifed in the toon bud transcriptome and the anthocyanin contents were comparatively analyzed between the purple toon (Black Youchun: BYC2) and green toon (Green Youchun: GYC2) (Zhao et al. [2017](#page-19-6)). Many putative unigenes, related to the terpenoids metabolism were also examined in the postharvest toon buds after cold storage (Zhao et al. [2019\)](#page-19-1). Two terpene synthase genes related to the terpenoids biosynthesis were isolated and functionally characterized (Hsu et al. [2012\)](#page-18-2). Liu et al. ([2019](#page-18-3)) have accomplished the sequencing of the complete chloroplast genome of *T. sinensis* using the Illumina sequencing platform. Apart from these reports, no other molecular information is available on the biosynthesis and regulation of the secondary metabolites in *T. sinensis*.

To a large degree, plant development and the biosynthesis of its secondary metabolites are regulated by the microRNAs (miRNAs) and their targets, encoding the functional genes or transcription factors (Samad et al. [2017](#page-19-7)). As post-transcriptional regulators, the miRNAs are an endogenous group of non-coding small molecular single RNA strands, 20–24 nucleotides (nt) in length (Bulgakov and Avramenko. [2015;](#page-18-4) Singh et al. [2018](#page-19-8)Zhang et al. 2018). In plants, the miRNAs reveal high diversity and conservative properties across species, with one of their distinct features being the hairpin structure in their precursors. The plant miRNAs show high complementarity to target the transcripts through base pairing and mediate endogenous specifc messenger RNA (mRNA) cleavage or translation repression at the post-transcriptional level, which results in silencing the target gene (Rogers and Chen [2013\)](#page-19-9). In general, the miRNAs are a class of key regulators of physiological processes in plants.

The involvement of the miRNAs in the post-transcriptional regulation of the biosynthesis of the secondary metabolites in medicinal plants has been reported in *Salvia miltiorrhiza*, *Catharanthus roseus*, *Picrorhiza kurroa*, *Xanthium strumarium*, and *Rauvolfa serpentina* (Fan et al. [2015;](#page-18-5) Prakash et al. [2015](#page-19-10), [2016](#page-19-11); Vashisht et al. [2015](#page-19-12); Xu et al. [2015\)](#page-19-13). Many genes related to the favonoid biosynthesis were targeted by the miRNAs, like phenylalanine ammonia lyase (*PAL*), dihydrofavonol 4-reductase (*DFR*), 4-coumarate CoA ligase (*4CL*), chalcone synthase (*CHS*) targeted by the miR1873, miR172i, and miR829.1, respectively (Biswas et al. [2016](#page-18-6)). Besides, some important genes were related to the terpenoid biosynthesis including acetyl-CoA-acetyltransferase (*AACT*), 3-hydroxy-3-methyl glutaryl coenzyme A reductase (*HMGR*), and 1-deoxy-D-xylulose-5-phosphate synthase (*DXS*) targeted by the miR5072 (Xu et al. [2015\)](#page-19-13), miR1134 (Fan et al. [2015\)](#page-18-5), and miR156 (Singh et al. [2016](#page-19-14)). Moreover, some transcription factors, such as myeloblastosis (*MYB*) and SQUAMOSA promoter-binding protein-like (*SPL*) proteins play crucial roles in the regulation of the biosynthesis of favonoids, anthocyanins and terpenoids. Gene encoding transcription factors mentioned above are targeted by the miRNAs, just as *MYB* and *SPL* targeted by miR858, miR159, and miR156, respectively (Yu et al. [2015](#page-19-15); Sharma et al. [2016](#page-19-16)).

Although the miRNAs have been identified in many medicinal plants, no reports are available at present on the miRNAs of *T. sinensis*. Toon sprouts are rich in favonoids and anthocyanins. However, the favonoid content varies among the diferent *T. sinensis* varieties. Our prior works showed that the total favonoid and anthocyanin concentrations in the BYC2 were remarkably higher than those in the GYC2 (Zhao et al. [2017](#page-19-6)). Therefore, the two *T. sinensis* varieties provided an ideal model for a clear understanding of the miRNA-mediated regulation of the favonoid biosynthesis at the post-transcriptional level. Besides, the unique favor of the toon sprouts or shoots is closely related to the formation of its volatile terpenoids (Zhao et al. [2019\)](#page-19-1). However, it is not clear that the miRNAs participate in the molecular events of the post-transcriptional regulation of the terpenoid biosynthesis in toon sprouts. The present study focuses on the identifcation of miRNAs and their targets together with our earlier transcriptome data in two toon sprout cultivars, i.e., the BYC2 vs GYC2. These results of this study revealed the expression profles and regulation patterns of miRNAs involved in the favonoids and terpenoids biosynthesis of toon sprouts. The miRNAs, which play potentially important roles in the formation of secondary metabolites, were identifed and analyzed in toon sprouts, and their expression levels were experimentally validated by quantitative real-time PCR (qRT-PCR). To the best of our knowledge, this is the frst report on sRNA high throughput sequencing in *T. sinensis*. Our results will be a valuable resource for the investigation of miRNA-mediated regulation of the favonoids and terpenoids biosynthesis in toon sprouts.

Material and Methods

Plant Materials

Toon sprouts (the first and second leaves from the top sprouts) were randomly collected from two *T. sinensis* cultivars (BYC-2 vs. GYC-2) raised under natural environmental conditions in the *T. sinensis* industry demonstration zone at Taihe County, Anhui, China, in April 2019. Samples were collected according to our previous protocol (Zhao et al. [2017](#page-19-6)). The toon sprouts samples thus collected were immediately frozen in liquid nitrogen and stored at −80 °C until future use for total RNA extraction, sRNA library construction and component analyses of the favonoids and terpenoids.

Extraction and Determination of Flavonoid Constituents and Volatile Terpenoid

Fifteen toon buds of each cultivar were mixed as one replicate and three replicates were performed. The total favonoid extractions and their quantifcation were performed per the protocol of Jiang et al. [\(2019](#page-18-7)). Briefy, 100 g of the toon sprout samples under refrigerator stored at−80 °C were ground into powder with liquid nitrogen, and then immersed in 1000 mL acidifed methanol (in a volume ratio of 1% HCl) for 24 h, under dark, at room temperature 20 °C. The extracts were then centrifuged at 12,000*g* for 20 min. The

supernatant was drawn, and the residues were re-extracted twice with 300 mL of acidifed methanol. Subsequently, the extracts were amalgamated together and concentrated to 30 mL under vacuum. Also, to remove the fat residue, the concentrated solution was extracted using petroleum ether (in a volume ratio of 1:2) three times; the hydrophilic phase was once dissolved in 30 mL of acidifed methanol. The samples were fltered through a 0.22 μm polyethersulfone membrane flter before HPLC analysis. The favonoid constituents were determined on a 1260 series HPLC instrument (Agilent, USA) equipped with Waters SunFire C18 Analytical Column (5 μ m, 250×4.6 mm). All the flavonoid constituents were monitored under uniform protocol using a UV detector at 254 nm. A gradient of water and acetonitrile was used as the mobile phase at column temperature 30 °C with a flow rate of 0.8 mL/min. The time programs for gradient elution was as given: 0–15 min, 10–30% acetonitrile (A), 70-90% water (B); 15–30 min, 30-60% acetonitrile (A), 40-70% water (B); 30–35 min, 60-100% acetonitrile (A), 0-40% water (B). The chromatogram of the standard substance of the selected favonoid constituents were purchased from Aladdin Company (Shanghai). To determined volatile terpenoids, GC–MS technology and corresponding experimental program used in our previous study were adopted and slightly modifed (Zhao et al. [2019\)](#page-19-1).

RNA Extraction, Quality Control, Small RNA Library Construction and Sequencing

The total RNAs of the toon sprouts were extracted from four samples (two biological repetition per cultivar) using RNAprep Pure Plant Kit (Tiangen Biotech, Beijing). To ensure the high quality of the RNA samples for sequencing, the quality of the total RNAs was assayed as follows: (1) RNA degradation and contamination was checked on 15% denaturing polyacrylamide gels. (2) RNA purity was monitored using the Thermo Scientific[™] NanoDrop™ 2000 spectrophotometer (Thermo, Waltham, MA). (3) RNA concentration was assayed using a Qubit®RNA Assay Kit in Qubit®2.0 Fluorometer (Life Technologies, CA, USA). (4) RNA integrity was checked using the RNA Nano 6000 Assay Kit of the Bioanalyzer 2100 system (Agilent Technologies, CA, USA). After all the RNA samples were qualifed, small RNA libraries were constructed using the TruSeq® Small RNA Sample Prep Kit. To accomplish this, 1 μg of total RNA per sample was used as the starting material to prepare the small RNA (sRNA) sequencing library. Briefy, 3′ adaptors were ligated to the specifc 3′OH group of the small RNA followed by the 5′ adaptor ligation using the T4 RNA ligase. The ligated products were reversely transcribed by reverse transcriptase and special primers, enriched by PCR and the amplifed products were electrophoresed on 15% urea polyacrylamide gel followed by sizes of the 140–200 bp fragment selected.

The small RNA library was quantifed using NanoDrop and validated for quality by assaying the insert size using the Agilent 2100 bioanalyzer. Finally, Q-PCR was used to quantify accurately the efective concentration of the library (the effective concentration of the Library > 2 nM) to ensure its quality. Sequencing libraries were generated for Illumina sequencing (NEB, USA) following the manufacturer's recommendations and index codes were added to attribute sequences to each sample. Clustering of the index-coded samples was performed on a cBot Cluster Generation System using TruSeq PE Cluster Kit v4-cBot-HS (Illumina), according to the manufacturer's instructions. After cluster generation was complete, the library preparations were sequenced on an Illumina Hiseq 2500 platform and singleend 50 nt reads were generated (Beijing Novogene Technologies Co., Ltd, Beijing, China). All small RNA raw sequences from the GYC2_1, GYC2_2, BYC2_1, and BYC2_2 of the two varieties toon sprout libraries have been deposited in the Sequence Read Archive of NCBI with the corresponding accession numbers SRR12778803, SRR12778802, SRR12778801, and SRR12778800.

Prediction of Known and Novel miRNAs

After the sequencing run was completed, the raw data were frst processed through the custom perl and python scripts. Clean data were obtained by removing the reads containing ploy-N, with 5' adapter contaminants, 3' adapter reads or the insert tag, less than 18 nt sequences and other low-quality reads from the raw data. The Rfam database was used to annotate and thus predict the non-coding RNAs such as the rRNA-, tRNA-, snRNA-, and snoRNA-derived sequences, etc. Next, the remaining sRNA sequences were mapped to the *T. sinensis* transcriptome sequence using the Bowtie software without mismatch, to analyze their expression and distribution on the reference (Langmead et al. [2009](#page-18-8)). The mapped sRNA tags were converged onto the miRBase v22.1 [\(http://www.mirbase.org/\)](http://www.mirbase.org/) for identifcation of the conserved miRNAs with zero mismatches, using the miR-Deep2 software. After obtaining the known miRNAs and completing the family classifcation, the remaining sRNA sequences without annotation were used to predict the potential novel miRNA candidates. Initially, the sRNA reads were aligned with the *T. sinensis* transcriptome sequence using Bowtie. The characteristics of the hairpin structure of the miRNA precursor can be used to predict the novel miRNA. The available software miREvo and miRDeep2 were integrated to predict the novel miRNA by exploring the secondary structure (Friedlander et al. [2011](#page-18-9); Wen et al. [2012](#page-19-17)). The reference standards for identifying the novel *T. sinensis* miRNA precursors were as follows (Meyers et al. [2008](#page-19-18); Axtell and Meyers. [2018\)](#page-18-10): (1) secondary stem-loop structure; (2) mature miRNA located in one arm of the

stem, complementary sequence portion with the miRNA located on the opposite other arm, and termed miRNA*; (3) the miRNA/miRNA* duplex had no loop or break and possessed less than 6 base mismatches; (4) higher negative MFEI values of the miRNA precursors than the other RNAs; and (5) two nucleotides 3' overhang in the miRNA: miRNA* duplex. The Dicer cleavage site and minimum free energy of the sRNA tags were identifed in the former steps. At the same time, custom scripts were employed to obtain the miRNA counts identifed as well as the base bias on the frst position, with certain length.

T.sinensis **miRNA Expression Profles, miRNA Target Identifcation and Function Annotation**

The expression levels of both the known miRNAs and novel miRNAs from the buds of two toon cultivars were estimated by Transcripts Per Million (TPM) and normalized through the following criteria normalization formula (Zhou et al. [2010\)](#page-19-19). Normalized expression=mapped miRNA counts / total clean read counts $\times 10^6$. Differential expression analysis between the BYC2 and GYC2 was performed using the DEGseq (2010) R package. The miRNAs having $p < 0.05$ and $\log 2$ -foldl change ≥ 1 in comparison, were set as the threshold for signifcantly diferentially expressed miRNAs (DE-miRNAs) (Audic and Claverie. [1997](#page-18-11); Baggerly et al. [2003](#page-18-12)). Blasting against the transcriptome data of the earlier reported two *T. sinensis* cultivars, a prediction of the potential target genes of the miRNA was done using the psRobot ([http://omicslab.genetics.ac.cn/psRobot/\)](http://omicslab.genetics.ac.cn/psRobot/) (Wu et al. [2012](#page-19-20)). Rigorous criteria were adhered to, as follows: mismatches between the miRNA/target were not to exceed four (G-U bases set as 0.5 mismatches); no more than two adjacent mismatches and 2.5 mismatches in positions 1–12 between 5' of the miRNA and target were permitted, and specifcally, no adjacent mismatches were to be present in positions 2–12, as well as mismatches in positions 10–11; the minimum free energy (MFE) of the miRNA/target duplex should be not $< 60\%$ compared to the MFE of the miRNA bound to its perfect complement. Targets were also functionally annotated by BLASTX (*e* value $1 \times e^{-10}$) against the UniProtKB/ Swiss-Prot and UniProtKB/TrEMBL databases for plants in our previous transcriptome data (Zhao et al. [2017\)](#page-19-6). Gene ontology (GO) annotation for the targets of DE-miRNAs was done using the WEGO software ([http://wego.genomics.](http://wego.genomics.org.cn/) [org.cn/\)](http://wego.genomics.org.cn/) (Ye et al. [2018](#page-19-21)). The targets of DE-miRNAs were mapped to the KEGG database ([http://www.genome.jp/](http://www.genome.jp/kegg/) [kegg/](http://www.genome.jp/kegg/)) to identify those genes involved in the favonoid and terpenoid pathways (Kanehisa et al. [2017\)](#page-18-13).

Expression Analysis of the miRNAs and Target Genes in Toon Sprouts by qRT‑PCR

The miRNAs were extracted from the toon sprouts using the miRcute miRNA Isolation Kit (Tiangen Biotech, Beijing) according to the manufacturer's instructions. The total RNA of the toon sprouts for qRT-PCR was isolated adopting the protocol similar to the one in the previous experiment for total RNA quality control for sRNA sequencing. The miRNA poly (A) tailing and RT-PCR amplifcations were performed using the miRcute Plus miRNA First-Strand cDNA Kit (Tiangen Biotech, Beijing). The RT-PCR amplifcations for the target RNAs were performed using Quantscript RT Kit (Tiangen Biotech, Beijing) following the manufacturer's instructions. The qRT-PCR of the miRNA and target genes were performed in Step One Plus Real-Time PCR Systems (Thermo Fisher Scientifc, Shanghai, China) using the miRcute Plus miRNA qPCR Kit (SYBR Green) (Tiangen Biotech, Beijing) and GoTaq-qPCR Master Mix Kit (Promega, Beijing, China), respectively. The primers for qRT-PCR were designed using Primer-BLAST ([https://](https://www.ncbi.nlm.nih.gov/tools/primer-blast/) [www.ncbi.nlm.nih.gov/tools/primer-blast/\)](https://www.ncbi.nlm.nih.gov/tools/primer-blast/) and synthesized by Sunya Biotechnology Company (Hangzhou). The primer sequences for the miRNAs and their targets are listed in Supplementary fle 8. The 20 μLvolume of the reaction mixture contained 2 μ L of the dilute template cDNA, 2 μ L of the primer pairs, 10 μL of 2× miRcute Plus miRNA PreMix (containing 2 μ L of 50 × ROX reference dye II), and 6 μ L of deionized water. The setting program of the qRT-PCR reaction for the miRNA quantity was as follows: denaturation at 95 °C for 15 min, followed by 40 cycles of 94 °C for 20 s, annealing and extension at 60 °C for 34 s. For the target ungenes, the reaction system and PCR parameters were set according to our previous criterion and procedures (Zhao et al. 2017). After the reactions, primer specificity was evaluated by the melting curve analysis. The miRNAs and corresponding target genes in the qRT-PCR quantity

were analyzed in three biological replicates and three technical replicates. The relative abundance of the miRNAs and target genes was determined using the 2−ΔΔCT method and normalized by U6 rRNA and β-actin as reference genes, respectively.

Statistical Analysis

The statistical analyses of the DEGs and DE-miRNA profles were performed using *SPSS* 19.0 (Chicago, IL, CA). Student t-test was used to assess for the potential diferences between the BYC2 and GYC2. **P*<0.05 represented the statistically signifcant diference. The values were expressed as mean \pm SD.

Results

Determination of Quality‑Related Flavonoid and Terpenoid Contents in Toon Sprouts

The contents of the favonoid in the toon sprouts of the BYC2 and GYC2 varieties were determined by the HPLC method (Table [1](#page-4-0)). The contents of the total favonoid in the BYC2 and GYC2 were found to be 5722.13 ± 196.80 μg/g and 4936.72 ± 249.54 µg/g, respectively. The contents of six favonoid monomers (except for rutin) namely, myricitrin, isoquercitrin, quercetin- 3 -O- α -L-arabinopyranoside, kaempferol-3-O-β-D-glucopyranose, quercitrin, and kaempferol-3-O- α -L-rhamopyranoside in the BYC2 were found to be 19.6, 38.3, 25.2, 32.8, 7.9, and 18.0% higher than those in the GYC2. However, the contents of the volatile terpenoid compounds between the two cultivars displayed a various change pattern (Table [2\)](#page-5-0). The contents of the monoterpenoids such as α -pinene and d-limonene contents were signifcantly higher in the GYC2 than in the BYC2. Some important sesquiterpenoids such as the contents

Table 1 The contents of the favonoid components (μg/g of fresh weight) in BYC2 and GYC2

Flavonoid components	Rt (min)	Molecular weight	Toon sprout cultivars $(\mu g/g)$		
			BYC2	GYC ₂	
Myricitrin	8.145	464.38	$314.11 + 4.67$	$262.60 + 6.31*$	
Rutin	9.384	610.52	$992.37 + 32.03*$	$1249.55 + 41.33$	
Isoquercitrin	9.984	464.38	$1765.06 + 91.93$	$1276.37 + 159.47*$	
Quercetin-3-O- α -L-arabinopyranoside	10.934	434.35	$1664.78 + 87.21$	$1329.76 + 95.46*$	
Kaempferol-3- O - β - D -glucopyranose	11.920	448.38	$411.12 + 25.00$	$309.66 + 9.74*$	
Ouercitrin	14.379	448.38	$274.14 + 2.10$	$254.00 + 2.51*$	
Kaempferol-3- O - α -L-rhamopyranoside	16.363	432.38	$300.55 + 4.41$	$254.76 + 3.78*$	
Sum			5722.13 ± 196.80	$4936.72 \pm 249.54*$	

Values are expressed as the means of three replicates \pm standard deviation

*Statistically signifcant diferences for the favonoid components in BYC2 and GYC2 (**P*<0.05; Student's *t* test)

Table 2 The contents of volatile terpenoid compounds (ng/g of fresh weight) in BYC2 and GYC2

Values are expressed as the means of three replicates \pm standard deviation

*Statistically signifcant diferences for terpenoid compounds in BYC2 and GYC2 (**P*<0.05; Student's *t* test)

of β-caryophyllene, caryophyllene, trans-β-farnesene, α-farnesene, and isolongifolene, 9,10-dehydro in GYC2 were found to be 83.0, 152.3, 51.3, 293.5, and 45.5% higher than those in the BYC2, respectively. Moreover, β-caryophyllene showed the highest accumulation in the GYC2, with an absolute value of 6215.39 ± 523.33 ng/g achieved.

High Throughput Sequencing of Small RNA Libraries of T. sinensis

In this study, the four sRNA libraries were constructed and sequenced using two toon sprout cultivars (BYC2 vs. GYC2) with two biological replicates per cultivar. As shown in Table [3,](#page-6-0) the total raw data of 19,174,385, 23,020,318, 13,560,132, and 16,930,140 reads were generated in four libraries, namely, the GYC2_1, GYC2_2, BYC2_1, and BYC2_2, respectively. After adapter removal and low-quality data (sequence < 17 **Table 3** Analysis of the small RNA sequencing from the toon sprouts of BYC2 and GYC2

	GYC ₂ 1	GYC ₂ 2	$BYC2$ 1	BYC ₂ 2
Total raw reads	19,174,385	23,020,318	13,560,132	16,930,140
Clean reads	18,596,858	22,252,682	13,056,247	15,791,016
Total small RNA reads	12,239,853	14,251,756	8.964.927	8,118,129
Mapped small RNA reads	11,341,399	12,582,255	7,539,982	6,815,160
Total unique reads	781,957	952,515	487,413	516,365
Mapped total pre-miRNA small reads	40,682	41,057	66,362	76.624
Mapped unique pre-miRNA small reads	868	1.277	874	818
Mapped hairpin	584	641	572	593
Mapped mature miRNA	250	295	261	225
rRNA, tRNA, snRNA, and snoRNA (mapped reads count)	4,207,049	4,385,655	2,078,935	1,734,949

Fig. 1 Length distribution of clean reads of four small RNA libraries in BYC2 and GYC2

nt) filtering, 18,596,858, 22,252,682, 13,056,247, and 15,791,016 clean reads were obtained, with the total small RNA reads being in the proportion of 65.82% (12,239,853), 64.05% (14,251,756), 68.66% (8,964,927), and 51.41% (8,118,129) in each library. The read length distribution was centered mainly around 20–24 nt and contained over 60% of the total reads. As depicted in Fig. [1](#page-6-1), the most abundant read length was 21 nt (11.03%- 14.21%), followed by 24 nt (10.23%-11.99%) and 22 nt (9.28%-11.17%) (Fig. [1\)](#page-6-1). Among them, 487–953 thousand unique reads corresponding to 7.54–12.58 million (about 83.95–92.66% of the total sRNA) reads were perfectly mapped to the *T. sinensis* transcriptome. The different types of the total sRNA sequences were further classified using the Bowtie software to blast the clean reads against the Rfam databases. The total counts of the annotated clean reads as tRNA, rRNA, snRNA, and snoRNA were 4,207,049, 4,385,655, 2,078,935, and

1,734,949 in GYC2_1, GYC2_2, BYC2_1, and BYC2_2, respectively. The remaining clean reads were aligned and edited in the Sequence Alignment Map (SAM) format and input into the miRDeep2 pipeline for the discovery of miRNA. In comparison, 818–1,277 unique reads corresponding to 40,682–76,624 reads were matched to the miRBase database. In total, 250–295 reads were found to match the known mature miRNAs collected from all plant species available in the miRBase database or be recognized as novel miRNAs in the *T. sinensis* transcriptome according to the miRDeep2 software.

Identifcation of Known miRNAs in T. sinensis Sprouts

To further identify the miRNA homologs in the *T. sinensis* sprouts, the remaining clean reads in the four libraries were aligned to the known miRNA in the miRBase (Release 22.1). 60,900, 70,254, 35,736, and 45,105 reads from

Fig. 2 Known miRNA families and their member numbers in the toon sprouts. **A** The x-axis represents the members in the diferent miRNA families. The y-axis shows the conserved miRNA family identifed in the BYC2 and GYC2. **B** 29 and 11 miRNA families included only one or two members

BYC2_1, BYC2_2, GYC2_1 and GYC2_2 libraries perfectly matched 243, 208, 230, and 275 known mature miRNAs, respectively. The total number of known miRNAs in the GYC2 was slightly higher than those present in the BYC2. In total, 331 known miRNAs belonging to 56 families were identifed in the four libraries, with an average of about six miRNA members per family (Fig. [2](#page-7-0)A). Among these known miRNA families, only one member was identifed in 29 miRNA families, while two members were identifed in 11 miRNA families (Fig. [2](#page-7-0)B). However, some miRNA families possessed several members. For example, miR159 was the largest family containing 30 members, followed by miR166, miR171and miR396 with 26, 24, and 24 members, respectively (Fig. [2](#page-7-0)A). These known miRNAs were aligned to all the plant species available in the miRBase database, among which *Arabidopsis thaliana*, *Oryza sativa*, and *Glycine max* were the most frequent ones. The transcript numbers of these miRNAs in the toon sprouts varied greatly among the miRNA families. Some only had several sequence reads, whereas others possessed hundreds of thousands of reads.

For example, most members of the miR166 family possessed more than 20,000 reads, and some of the miR166 family and most members of the miR159 family had more than 5,000 reads, and most of the miR159, miR319 and miR482 families possessed more than 2,000 read, while the majority of the other miRNAs had only a few hundred, or even fewer reads has been furnished in Supplementary fle 1.

Identifcation of Novel miRNAs in Toon Sprouts

The remaining sRNAs that were unannotated to the miR-Base were searched against the *T. sinensis* transcriptome, using the miRDeep2 software to identify the novel miR-NAs that may be specifc to the toon sprouts. Based on the recognition criteria of the potential novel miRNA precursor, a total of 23 novel miRNAs were identifed in the four sRNA libraries (Table [4\)](#page-8-0). The novel miRNA sequences varied in the range of 18–24 nt, with an average length of 21 nt. The pre-miRNAs lengths varied in the range of 53–293 nt, with the average being 130 nt. The average **Table 4** List of putative novel miRNAs in the toon sprout

Name Sequence Length (nt) Arm Position in gene ID Precursor

Table 5 Nucleotide composition and bias for the frst position of the novel miRNAs with diferent length from the 5' end of the sequences

minimum folding free energy value of the hairpin structures was −45.22 kcal/mol in the toon sprouts, which is higher than that reported in *Arabidopsis* (−59.50 kcal/ mol). The secondary structures of the 23 novel miRNA precursors have been furnished in Supplementary file 2. As shown in Table [5](#page-8-1), the frst nucleotide base analysis indicated that a large majority of the novel miRNAs started the frst nucleotide with 5' uracil (U) not guanine (G) and U (73.91%) were the most dominant nucleotides in the frst position, which is consistent with the typical miRNA nucleotide bias distribution patterns.

Diferential Expression of the miRNAs Between the Two Toon Sprout Varieties

Pairwise analysis of the DE-miRNAs between the BYC2 and GYC2 was performed using the heat map method (Fig. [3\)](#page-9-0). There were totally 52 (25 up-regulated, and 27 down-regulated) signifcantly DE-miRNAs between the BYC2 vs GYC2 (log₂ ratio \geq 1, adjusted *P* value \leq 0.05). Among these, the miR166, miR168, miR408, and miR482 and novel miRNAs 5, 7, 13, 23, and 33 were up-regulated, while the miR156, miR171, miR172, miR394, miR396, miR403, miR858 families together with the novel miR-NAs 3 and 27 were down-regulated between the BYC2 and

Energy (kcal/mol)

Fig. 3 Clustering analysis of the DE-miRNAs was shown using heatmap. Heatmap represents the miRNAs signifcantly altered by the Baggerley's test (*P*<0.05) in four libraries. The blue color indicates low expression of the miRNAs, while red indicates the high expression of the miRNAs

GYC2 (Supplementary fle 3). Interestingly, the levels of DE-miRNAs were found to be remarkably diferent among the diferent miRNA families. For example, the miR166, miR172, miR156 and miR858 exhibited greater diferential expression than did the miR396 and miR168. Moreover, diferent members of the same miRNA family displayed diferent expression levels. For example, the miR166a and miR166d exhibited significantly reverse expression patterns. Compared with the GYC2, the miR166a was signifcantly up-regulated in the BYC2, whereas the miR166d was signifcantly down-regulated (Supplementary fle 3). It is noteworthy that some DE-miRNAs were predicted to play crucial roles in the regulation of the secondary metabolism in the toon sprouts.

Target Prediction and Functional Annotation

A total of 2233 target genes (or 18,224 transcripts of 2233 target genes) of miRNAs were predicted in the toon sprouts using the psRNA Target software (Supplementary fle 4). Moreover, a majority of the miRNAs possessed multiple target unigenes, and the target unigenes number of miRNAs varies greatly from 1 to 1986. For instance, tsi-miR156z (belonging to the miR156 family) topped the list with 1986

Fig. 4 Gene ontology (GO) enrichment was classifed for the potential target unigenes of the DE-miRNAs. Red, blue, and green represent the three GOs, namely, biological progress, cellular component, and molecular function, respectively

target transcripts, followed by tsi-miR5658, tsi-miR414 and tsi-miR172c-3p which had 1915, 1781, and 1627 target transcripts, respectively. Among all the novel miRNAs, the novel_28 possessed the highest number of target transcripts (1377) while the lowest number of targets was found in novel_12 (36); these data have been furnished in Supplementary file 5.

To better understand the function of the miRNAs in the toon sprouts, the target unigenes of DE-miRNAs were annotated through the analysis of GO enrichment, (Supplementary fle 6) and the KEGG pathway (Supplementary fle 7: Table S5). The GO enrichment analysis showed that the target unigenes of DE-miRNAs appeared to be signifcantly enriched in the methyl indole-3-acetate esterase activity (GO: 0080030), methyl salicylate esterase activity (GO: 0080031), and methyl jasmonate esterase activity (GO: 0080032) in molecular function. Under biological process, pyrimidine ribonucleotide salvage (GO: 0010138), pyrimidine nucleotide salvage (GO: 0032262), UMP salvage (GO: 0044206), and CTP salvage (GO: 0044211) were signifcantly enriched. For the cellular component category, the actin cytoskeleton (GO: 0015629) and nuclear membrane (GO: 0031965) were determined to be highly represented groups (Fig. [4\)](#page-10-0).

The KEGG pathway analysis demonstrated highly signifcant enrichment in the RNA transport, spliceosome, mRNA

surveillance pathway, endocytosis, and RNA degradation (Fig. [5](#page-11-0)). Some metabolic pathways, including the other types of O-glycan biosynthesis, galactose metabolism, and purine metabolism, vitamin B6 and ascorbate metabolism, as well as essential amino acid and fatty acid biosynthesis were ranked among the top 20 enrichment pathways (Supplementary fle 7). To identify a diference in the favonoid contents between the BYC2 and GYC2, we focused on those miRNAs that may negatively regulate the unigenes associated with the favonoid biosynthesis. In our study, there are key enzyme unigenes as potential targets regulated by *T. sinensis* miRNAs, such as cinnamic acid 4-hydroxylase (*C4H*), shikimate O-hydroxycinnamoyltransferase (*HCT*), dihydrofavonol-4-reductase (*DFR*), leucoanthocyanidin dioxygenase (*LDOX*), leucoanthocyanidin reductase (*LAR*), and anthocyanidin 3-O-glucosyltransferase (*UGT*) which were predicted to be targeted by the tsi-miR403-3p, tsi-miR168b, tsi-miR166a, tsi-miR395a, tsi-miR319i, tsi-miR172c, and tsi-miR396b, respectively. The novel_27 was predicted to be a mutual regulator of the targets in 4-coumarate CoA ligase (*4CL*), and chalcone synthase (*CHS*) (Table [6](#page-12-0)).

By mapping these target unigenes of DE-miRNAs to the KEGG pathway, some targets encoding putative enzymes in the terpenoid biosynthesis were identifed in *T. sinensis*. For example, the upstream target enzymes were located in the biosynthesis of the terpenoid backbone, including 3-hydroxy-3-methylglutaryl-CoA reductase (*HMGR*), mevalonate kinase (*MK*), phosphomevalonate kinase (*PMK*), and farnesyl diphosphate synthase (*FPPS*) in the mevalonate (*MVA*) pathways in the cytoplasm and 1-deoxy-D-xylulose-5-phosphate synthase (*DXS*), and 4-hydroxy-3-methylbut-2-enyl-diphosphate synthase (*HDS*) in 2-C-methyl-D-erythritol-4-phosphate (MEP) in the plasmid. These unigenes were predicted to be targets by tsi-miR408-3p, tsi-miR171a, novel_28, tsi-miR390b-5p, tsi-miR-1260, and novel_27. The downstream targets belonged to the terpene synthases (*TPS*) in the terpenoid biosynthesis. For example, (R)-limonene synthase (*LS*) and linalool synthase (*LIS*) were targeted by tsi-miR395d and tsi-miR172c-3p in monoterpenoid biosynthesis. Terpene synthase 11 (*TPS11*), (E)-β-farnesene synthase (*FAS*), and (-)-germacrene D synthase (*GDS*) in the biosynthesis of sesquiterpenoid were targeted by the tsi-miR8155, tsimiR482d-5p and tsi-miR395b-3p. Besides, a large number of transcription factors that could be involved in regulation of secondary metabolite biosynthesis, growth and development in the toon sprouts were predicted as the candidate targets of some conserved miRNA families. For example, the squamosa promoter-binding-like protein (*SPL*) tran-scripts (Yu et al. [2015\)](#page-19-15), anthocyanin regulatory C1 protein (*MYB*) transcripts (Xia et al. [2012](#page-19-22)), WD40-repeat protein (*WD40*) transcripts, homeodomain leucine zipper family (*ZIP*) transcripts (Sharma et al. [2016](#page-19-16)), ethylene-responsive

Statistics of Pathway Enrichment

Fig. 5 Top 20 KEGG pathways enrichment was analyzed for the potential target unigenes of the DE-miRNAs. A large enrichment factor denotes a high degree of enrichment. The lower q-value represents the more signifcant enrichment of the DEGs

transcription factor (*ERF*) transcripts, WRKY transcription factor (*WRKY*) transcripts (Sun et al. [2017\)](#page-19-23), and auxin response factor (*ARF*) transcripts were potentially targeted by the miR156, miR858, miR159, miR396, miR166, miR167, miR172, and miR160 families, respectively (He et al. [2019\)](#page-18-14).

qRT‑PCR Experimental Validation and Analysis of miRNAs and their Targets

The qRT-PCR was performed to validate the sRNA sequencing results and analyze the relationship between these miRNAs and their potential targets involved in the metabolic pathways of the favonoid and terpenoid. Overall, the relative expression levels of the 40 miRNAs and 51 unigenes were quantifed by the qRT-PCR. The qRT-PCR results of the miRNAs matched the expression profles obtained by the sRNA sequencing, indicating that the sRNA sequencing data was credible and reliable. On the whole, the expression levels of the corresponding targets exhibited a trend opposite to those of the miRNAs (Figs. $6, 7, 8$ $6, 7, 8$ $6, 7, 8$ $6, 7, 8$ $6, 7, 8$). In the flavonoid pathway, the tsi-miR4995, tsi-miR403-3p, novel_27, tsi-miR171c-5p, novel_34, tsi-miR172c, tsi-miR319i, tsi-miR408d, and tsi-miR396b showed signifcantly negative relationships with their responding target unigenes, *PAL*, *C4H*, *Trans-CMO*, *4CL*, *HCT-2*, *CHS*, *DFR*, *LDOX*, *LAR-1*, *LAR-2*, and *UGT* (Fig. [6](#page-15-0)). To explore the function of the miRNAs on the terpenoid biosynthesis in the toon sprouts, the expression profiles of the miRNA-target unigene pairs were selected for qRT-PCR analysis with P value < 0.05 as the signifcant diference. Among these, the expression level of 8 miRNAs was found to have a remarkably negative

Table 6 Potential targets involved in the favonoid and terpenoid metabolism and their regulation for the miRNAs in the toon sprout

Metabolic pathways	miRNA ID	miRNA name	Target ID		Score Annotation for targets	Gene name
Flavonoids-related miRNAs	gma-mi $R4995$	$tsi-miR4995$	CL298.Contig3_All	6	Phenylalanine ammonia lyase	PAL
	$ath-miR403-3p$	$tsi-miR403-3p$	CL11631.Contig1 All	5.5	Cinnamic acid 4-hydroxylase	C4H
	novel 27	novel_27	CL8791.Contig1_All	6	4-coumarate: coenzyme ligase	4CL
	ata-miR395b-3p	$tsi-miR395b-3p$	CL5643.Contig1 All	5	Coumarate-3-hydroxylase	C3H
	gma-miR168b	tsi-miR168b	CL11692.Contig2_All 5		Shikimate O-hydroxycin- namoyltransferase	$HCT-1$
	ath- $miR171c-5p$		tsi-miR171c-5p CL3044.Contig6 All	5.5	Shikimate O hydroxycin- namoyltransferase	$HCT-2$
	pta-miR159a	tsi-miR159a	CL8681.Contig4 All	6	Caffeoyl-CoA O-methyltrans- ferase	CC0AOMT
	ath- $miR403-3p$	$\text{tsi-mi}R403-3p$	CL11631.Contig1_All 5.5		Trans-cinnamate 4-monooxy- genase	Trans-CMO
	novel 27	novel_27	CL6701.Contig1_All	6	Chalcone synthase	CHS
	novel 27	novel 27	CL2051.Contig1 All	6	Flavanone 3-dioxygenase	F3H
	vvi-miR166a	tsi-miR166a	CL9131.Contig1 All	5	Flavonol synthase	FLS
	novel 34	novel 34	CL4232.Contig2 All	5	Dihydroflavonol-4-reductase	DFR
	ath-miR172c	tsi-miR172c	CL6954.Contig1 All	6	Leucoanthocyanidin dioxy- genase	LDOX
	ptc-miR319i	tsi-miR319i	CL11381.Contig1 All 4.5		Leucoanthocyanidin reduc- tase	$LAR-1$
	gma-miR408d	tsi-miR408d	CL11381.Contig2_All 6		Leucoanthocyanidin reduc- tase	$LAR-2$
	vvi-miR396b	tsi-miR396b	CL4956.Contig2_All	5	UDP-glycosyltransferase	UGT

Table 6 (continued)

Metabolic pathways	miRNA ID	miRNA name	Target ID		Score Annotation for targets	Gene name
Transcription factor-related miRNAs	ath-mi $R156a-5p$		tsi-miR156a-5p CL1040.Contig5_All		Squamosa promoter-binding- like protein	SPL1
	$ath-miR156a-5p$		tsi-miR156a-5p CL1666.Contig2_All	-1	Squamosa promoter-binding- like protein	SPL ₂
	ath-miR858a	tsi-miR858a	CL598.Contig1_All	3	Anthocyanin regulatory C1 protein	$MYBC1-1$
	aqc-miR159	$tsi-miR159$	CL6837.Contig2_All	5.5	Transcription factor MYB1R1	MYB1R1
	ath-miR858a	tsi-miR858a	CL8713.Contig1_All	3	Anthocyanin regulatory C1 protein	$MYBC1-2$
			gma-miR159b-3p tsi-miR159b-3p CL3567.Contig2_All	θ	Transcription factor GAMYB	MYB
	zma-mi $R396g-3p$ tsi-mi $R396g-3p$		CL190.Contig3 All	5.5	WD40-repeat protein	WD40-1
	ppt-miR167	tsi-miR 167	CL5508.Contig3_All	4	WD40-repeat protein	WD40-2
	vvi-miR166a	tsi-miR166a	CL1000.Contig1_All	0.5	Homeobox-leucine zipper protein ATHB-15-like	HD-ZIP
	stu -mi $R172c$ -3p		tsi-mi R172c-3p CL4727.Contig1_All	6	Ethylene-responsive tran- scription factor	ERF
	stu-mi $R172c-3p$		$\text{tsi-mi} \text{R} 172c-3p$ CL9023. Contig1_All	-6	WRKY transcription factor	WRKY
	g ma-mi $R160b$	$tsi-miR160b$	CL2844.Contig1_All	$\overline{0}$	Auxin response factor	ARF

Table 6 (continued)

correlation with their target unigenes including the tsimiR-1260, novel_28, tsi-miR390b-5p, tsi-miR-107b, tsimiR156g, tsi-miR8155, tsi-miR482d-5p, and tsi-miR395- 3p, targeted for *DXS-1*, *HDR*, *FPPS*, *GPPS*, *GGPPS-1*, *TPS11*, *FAS*, and *GDS* (Fig. [7\)](#page-16-0). Moreover, the other differentially expressed miRNA-target unigene pairs between the BYC2 and GYC2 were investigated in our study, and have been annotated as vital transcription factors in the regulation of secondary metabolism in plants, including SPL, MYB, WD40, WRKY, ERF, and ARF. A negative correlation was observed between the expression profles of six miRNAs (tsi-miR156a-5p, tsi-miR858a, tsi-miR159, tsi-miR167, and tsi-miR172c-3p, and tsi-miR160b) and their targets *SPL1*, *SPL2*, *MYBC1-1*, *MYBC1-2*, *MYB1R1*, *MYB*, *WD40-2*, *ERF*, *WRKY*, and *ARF* (Fig. [8](#page-16-1)). The results stated above were consistent with our high-throughput sequencing data, which once again demonstrated that the credibility of our sRNA sequencing data.

Discussion

T. sinensis is one of the most highly valuable plants classifed under Medicine Food Homology (MFH) in China. The natural properties among diferent varieties reveal signifcant diversity during evolution (Chen et al. [2018](#page-18-15)). In Taihe County of the Anhui Province of China, two fne *T. sinensis* strains were obtained, and extensively planted after a long cultivation and domestication history. One variety was called purple toon or "Black Youchun" (BYC2) for its rich favonoid or anthocyanin, the other named green toon or "Green Youchun" (GYC2) for its strong aromas, is known as mahogany and used for architecture or furniture. Our study confrmed that the presence of signifcant diferences in the total favonoid contents between BYC2 and GYC2, with the favonoid components ranging from 254.00 to 1765.06 μg/g of fresh toon sprouts. Rutin, isoquercitrin, and quercetin-3- O -α-L-arabinopyranoside are the three main representative components, known for their high abundance. The total favonoid content in the BYC2 was higher than that in GYC2, which is consistent with their phenotypic property. However, compared with the favonoids, the content of the volatile terpenoid in the GYC2 was higher than in the BYC2. The diference in the abundance of volatile terpenoid compounds between the BYC2 and GYC2 may account for their respective characteristics aromas.

To explore the biosynthesis pathways of favonoid and terpenoid, transcriptome sequencing was performed earlier to explain the diference in the anthocyanin contents between the BYC2 and GYC2. The results showed that the expression levels of some principal genes related to the favonoid biosynthesis were up-regulated more signifcantly in BYC2 than GYC2 (Zhao et al. [2017\)](#page-19-6). The diference in the gene expression profles could conspicuously contribute to the diference in the secondary metabolites in the toon sprouts. The miRNAs were considered to be

Fig. 6 The qRT-PCR validation of miRNAs and their target unigenes related to the favonoid biosynthesis in BYC2 and GYC2. All the values represent an average±SD (*n*=6). The error bars with asterisks are the statistically signifcant diferences (**P*<0.05; Student's *t* test)

in control of the vital physiological processes in plants, including the regulation of the secondary metabolic pathways, mainly at the post-transcriptional level. To the best of our knowledge to date, this is the frst report on attempting to investigate and explore the miRNAs and their potential targets in *T. sinensis*. In view of the lack of genomic information for *T. sinensis*, high throughput RNA sequencing could be performed to reveal the miRNA-target pairs which control the metabolic flows of the flavonoid and terpenoid. To study the miRNA-mediated regulation of the gene expression at the post-transcriptional level in the toon sprouts, sRNA sequencing combined with the previous transcriptome data was done to identify the miRNA candidates and their potential targets. In this study, the sRNA sequencing was done to characterize the miRNAs and verify their expression profles in both the BYC2 and GYC2. In fact, 22 million or more clean reads were obtained from the four libraries. The sRNAs in the toon

Fig. 7 The qRT-PCR validation of the miRNAs and their target unigenes related to the biosynthesis of volatile terpenoids in BYC2 and GYC2. All the values represent an average \pm SD (*n*=6). The

error bars with asterisks are the statistically signifcant diferences (**P*<0.05; Student's *t* test)

Fig. 8 The qRT-PCR validation of the miRNAs and their transcription factor-associated target unigenes in BYC2 and GYC2. All the values represent an average \pm SD ($n=6$). The error bars with asterisks are the statistically significant differences (* P <0.05; Student's *t* test)

sprouts exhibited a wide range of variations in length, with the 21-nt RNAs being the most abundant type, followed by 24-nt and 22-nt sRNAs, representing the typical length of the Dicer-cleaved mature plant miRNAs (Moro et al. [2018\)](#page-19-24). Such a distribution pattern of the sRNAs according to length, was also recorded for *Moringa oleifera*, *Solanum tuberosum*, and *Glycine max* (Li et al. [2015](#page-18-16); Pirro et al. [2016](#page-19-25); Qiao et al. [2017](#page-19-26)), implying that most miRNAs in the toon sprouts chiefy mediated the cleavage of the target genes, as well as the post-transcriptional inhibition and chromatin modeling of target genes (Axtell [2013](#page-18-17); Lee and Carroll. [2018\)](#page-18-18). Among the four sRNA libraries, a total of 331 known miRNAs classifed under 56 families and 23 novel miRNAs were identifed in the BYC2 and GYC2. Most of the known miRNAs of the toon sprouts exhibited a high degree of sequence conservation with the other plants

in the miRBase database and a comparatively higher read number. Among the miRNAs of the toon sprouts identifed, 44 known miRNAs and 8 novel miRNAs were statistically calculated as DE-miRNAs between the BYC2 and GYC2. This implied that these DE-miRNAs may be variety-specifc and play crucial roles in the phenotypic determination of the two varieties. Furthermore, the majority of the plant miRNAs possessed almost perfect matches to their targets (Jones-Rhoades et al. [2006](#page-18-19)). This feature facilitated the identifcation of their potential targets in the toon sprout. At the same time, it could also provide certain vital information about their putative functions. In our analysis of the target unigenes, a substantial number of potential targets were aligned to the previous transcriptome data. A single miRNA has multiple target genes, whereas a target gene may be recognized and regulated by multiple miR-NAs (Wei et al. [2015;](#page-19-27) Licursi et al. [2019](#page-18-20)). Further studies focusing on the miRNA-mediated the regulation of the favonoid and terpenoid pathways are mandatory to elucidate diference in the abundance of the secondary metabolites between the BYC2 and GYC2 varieties. Several miRNAs were bioinformatically predicted to target the unigenes in the biosynthesis pathway of the favonoid, including *PAL*, *C4H*, *4CL*, *CHS*, *DFR*, and *UGT*, etc. A high expression level of miRNA that targets the genes related to favonoid formation may inhibits the total favonoid accumulation. For both the BYC2 and GYC2, the expression levels of the tsi-miR4995, tsi-miR403-3p, novel_27, tsi-miR171c-5p, novel_34, tsi-miR172c, tsi-miR319i, tsi-miR408d, and tsi-miR396b were inversely correlated with the total favonoid content. The key enzyme genes involved in the favonoid biosynthetic pathway that were targeted by the miRNAs were previously recorded in *Podophyllum hexandrum*, such as the *4CL* and *CHS* targeted by the phemiR172i and phe-miR829.1, respectively (Biswas et al. [2016\)](#page-18-6). A similar study was reported in both genotypes of soybean, gma-miR396 and gma-miR5434, which demonstrated an inverse relationship with their corresponding targets *UGT* and *CHI* (chalcone isomerase), respectively (Gupta et al. [2019](#page-18-21)). The favor of toon sprouts consists of diverse volatile terpenoid compounds, which were biosynthesized separately in two distinct pathways, the MVA and MEP, respectively. From the target prediction, a total of 13 miRNA-target pairs were identifed, that seemed to be directly relevant to the biosynthesis of these terpenoids (Table [5](#page-8-1)). Among these miRNAs, the expression levels of 8 miRNAs were negatively correlated with the terpenoid contents in the BYC2 and GYC2. For instance, *DXS-1* targeted for tsi-miR-1260 and *HDR* targeted for novel_28 in the MEP pathway, and *FPPS* targeted for the tsi-miR390b-5p, *GPPS* targeted for tsi-miR-107b, *GGPPS* -1 targeted for the tsi-miR156g, *FAS* targeted for the tsi-miR8155, *TPS* targeted for the tsi-miR482d-5p, and *GDS* targeted for the tsi-miR395b-3p in the downstream pathway of the terpenoid biosynthesis. These results indicated that compared with the BYC2, the high abundance of volatile terpenoid in GYC2 was due to the relatively lower levels of expression of these miRNAs. Samad discovered that *DXS* and *DXR* were targeted by pmi-miR396a and pmi-miR398f/g in the MEP pathway, respectively (Samad et al. [2019\)](#page-19-28). However, in our study, these genes were targeted by the *T. sinensis*specifc miRNAs that were diferent from the reports cited above. A plausible reason is that, in diferent species, different miRNAs were applied to regulate their targets.

More importantly, the target prediction in this study revealed that certain miRNAs not only targeted the enzyme genes related to the metabolic pathways, they also negatively regulated several transcription factors (TFs). These TFs play a crucial regulatory role in plant growth, development and biosynthesis of secondary metabolites. For example, four *MYB* unigenes were also targeted by ath-miR858a and aqcmiR159. A similar study showed that ath-miR858a targeted the *R2R3-MYB* involved in the biosynthesis of favonoid in *Arabidopsis thaliana*, and the overexpression of miR858a in transgenic *Arabidopsis* resulted in the down-regulation of several *MYBs* and inhibition of the favonoid biosynthesis (Sharma et al. [2016](#page-19-16)). A decrease in the miR858 activity resulted in favonoid accumulation in the *Arabidopsis* leaves and enhanced its resistance to pathogen infection (Camargo-Ramírez et al. [2018](#page-18-22)). The WD40 protein was reported to be an essential component of the MYB-bHLH-WD40 (MBW) transcription complex for anthocyanin biosynthesis (Sunitha et al. [2019\)](#page-19-29). The *WD40* transcripts, as potential targets of tsi-miR167 showed higher expression in the BYC2 than in the GYC2. The MBW complex could regulate the *DFR* and *UFGT* expressions to control the anthocyanin biosynthesis in *Arabidopsis* (Xu et al. [2014;](#page-19-30) Yang et al. [2018\)](#page-19-31). The SPLs are the other TFs widely prevalent in plants, which play an important role in plant growth and development, primary and secondary metabolism (Gou et al. [2012](#page-18-23); Yu et al. [2012](#page-19-32)). In *Arabidopsis*, the pattern of favonoid or anthocyanin accumulation was under the regulation of miR156-targeted *SPL* gene. The SPLs acted as the negative regulators of anthocyanin accumulation by destabilizing the MBW complex (Gou et al. [2012\)](#page-18-23). On the other hand, the SPLs could directly bind to the *TPS* promoters to act as positive regulators of the biosynthesis of volatile terpenoids (Yu et al. [2015\)](#page-19-15). In our study, the results of the sRNA sequencing and qRT-PCR showed that the tsi-miR156a-5p signifcantly up-regulated, whereas the expression of its targets *SPLs* were down-regulated in the BYC2 compared to that in the GYC2, which was in accordance with the *TPS* expression level and content of volatile terpenoid as stated above. The tsi-miR172c-3p and tsi-miR160b possibly targeted the *ERF*, *WRKY* and *ARF* TFs to play crucial roles in sucrose signaling. The miR172 and miR160 might target the *ERF* and *ARF* to activate

auxin-mediated signaling (Gao et al. [2019](#page-18-24); He et al. [2019](#page-18-14)). All of these signal transduction processes would induce a profound impact on the activities of the structural genes, and subsequently construct a complex molecular network mechanism to regulate secondary metabolites biosynthesis in the toon sprouts.

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Author contributions HZ, WZ, and GK conceived and designed this experiment. HZ drafted the manuscript. WL and CQ collected samples of toon sprouts. YC and SF extracted and assayed favonoid components and volatile terpenoid compounds. PG, HZ and WZ carried out qRT-PCR experiments and analyzed the data. All authors read and approved the manuscript.

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Declarations

Conflict of interest The authors declare no confict of interest.

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