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Identification and validation of reference genes for quantitative real-time PCR studies in long yellow daylily, *Hemerocallis citrina* Borani

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Abstract

Gene expression analysis using reverse transcription quantitative real-time PCR (RTqPCR) requires the use of reference gene(s) in the target species. The long yellow daylily, Hemerocallis citrina Baroni. is rich in beneficial secondary metabolites and is considered as a functional vegetable. It is widely cultivated and consumed in East Asian countries. However, reference genes for use in RT-gPCR in H. citrina are not available. In the present study, six potential reference genes, actin (ACT), AP-4 complex subunit (AP4), tubulin (TUB), ubiquitin (UBQ), 18S and 60S ribosomal RNA, were selected and their expression stability in different developmental stages, organs and accessions was evaluated using four statistical software packages (geNorm, NormFinder, BestKeeper, and RefFinder). For commercial flower buds of different landraces, the combination of 60S, TUB, and AP4 was appropriate whereas ACT and 60S was suitable for normalization of different organs. In addition, AP4 exhibited the most stable expression in flower buds among different developmental stages. UBQ was less stable than the other reference genes under the experimental conditions except under different organs was 18S. The relative expression levels of two genes, primary-amine oxidase (HcAOC3) and tyrosine aminotransferase (HcTAT) which play important roles in alkaloid biosynthesis were also examined in different organs of the 'Datong' landrace, which further confirmed the results of selected reference genes. This is the first report to evaluate the stability of reference genes in the long yellow daylily that can serve as a foundation for RT-qPCR analysis of gene expression in this species.

Introduction

The long yellow daylily (LYD hereinafter), or yellow flower vegetable (huang hua cai in Chinese), *Hemerocallis citrina* Baroni., is a perennial herb in the family Liliaceae, which is native to central and northern China, the Korea Peninsula, and Japan [1]. LYD is widely cultivated in this region and used as an ornamental plant, vegetable or medicinal plant because of its



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beautiful flower, pleasant flavor, and beneficial secondary metabolites; thus it is also considered as a functional vegetable crop [2]. The consumed part of this plant is mainly its flower buds, which are harvested before flowering. The LYD returns green in March, blooms from June to September in the summer. This crop is easily adaptable to various growth environments.

The alabastrums of LYD are rich in rutin, hesperidin, and colchicine. These secondary metabolites are used to treat anxiety and swelling [3, 4]; they also have their applications in modern medicine [5]. The chemosynthesis and pharmacology of secondary metabolites from plants have been extensively investigated in a number of plant species, but with no report in LYD so far. Molecular biology methods have been used to study the biosynthetic pathway of secondary metabolites and to examine functional genes in plants [6]. These approaches can be used to identify the metabolic pathways of active constituents in plants and to determine functional genes and their expression patterns in these pathways [7].

Reverse transcription quantitative real-time PCR (RT-qPCR) is widely used to analyze relative gene expression abundance in living organisms. Many factors influence the reliability of the results including RNA quality, expression levels of target genes and other factors that contribute to non-uniform test results [8, 9]. To obtain the true differences in the expression levels of target genes by RT-qPCR, stably expressed reference genes are used as internal controls for standard correction [10, 11]. It is difficult to find ideal reference genes that are stable under diverse experimental conditions. The expression of reference genes may vary depending on plant developmental stages, organs, varieties and physiological conditions [12]. For example, in *Lilium brownii*, *EF1* α and *18S rRNA* were the most stable reference genes for total samples, while *psaA* and *EF1* α were optimally stable in stressed root tissues [13]. For *Hedera helix*, *Fbox* gene was more stable than other examined genes under all analysis conditions, except under abscisic acid (ABA) treatment for which *40S rRNA* was the most stable reference gene [14]. Thus, it seems there are no universal reference genes, and the selection has to be conducted in individual species.

In the present study, the expression stability of six commonly used candidate reference genes (*18S rRNA*, *60S rRNA*, *UBQ*, *AP4*, *ACT*, and *TUB*) were examined in different growth stages, organs and landraces of LYD. The expression stability of these reference genes was analyzed by geNorm, NormFinder, and BestKeeper. RefFinder was used to integrate information and obtain a comprehensive ranking of the six candidate reference genes. In addition, the expression levels of two target genes in LYD, *HcAOC3 (primary-amine oxidase)* [15] and *HcTAT (tyrosine aminotransferase)* [16–18] that play roles in biosynthesis of alkaloids, were used to verify the reliability of the selected reference genes. The results showed that *AP4*, the combination of *60S*, *TUB*, *AP4*, or *ACT* along with *60S* was suitable for normalization in different developmental stages, landraces, and organs of LYD, respectively.

Materials and methods

Plant materials and treatments

Three LYD accessions, 'Datong', 'Panlong', and 'Changzuizi' were used in the present study. All of them were perennial landraces that were grown from tuber with buds since 2011. Plants were maintained in the *Hemerocallis* germplasm nursery at Shanxi Agricultural University, Taigu, China, where the summer average temperature is 22.8°C and rainfall concentrates in July to September. We investigated expression of six candidate reference genes in the 'Datong' landrace at three development stages based on the length of flower bud: <5 cm, 5–10 cm and >10 cm (the maximum length of the flower bud of 'Datong' was 15 cm before anthesis). We compared organ-specific expression of these genes in the root, leaf, and flower bud (>10 cm)



Fig 1. Commercial stage flower buds of different landraces and flower buds at different developmental stages of 'Datong'. A, B and C are commercial-stage flower buds of 'Panlong', 'Changzuizi' and 'Datong' landraces, respectively. D and E are flower buds of 'Datong' landrace at 0-5cm and 5-10cm stage, respectively.

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tissues of 'Datong' plants which were all collected at florescence. Finally, we also compared expression of these genes in the flower buds at commercial harvest stage (the day before flowering) from 'Changzuizi,' 'Panlong,' and 'Datong' landraces (Fig 1, S1 Fig). In all treatments, there were three biological replicates for each sample. The collected samples were immediately frozen in liquid nitrogen and stored at -80°C for RNA extraction.

RNA isolation and cDNA synthesis

Total RNA was extracted using an RNAprep Pure Plant Kit (Tiangen, Beijing, China) according to manufacturer's protocols. The RNA concentration and purity were determined with a NanoDrop 2000c Spectrophotometer (Thermo Fisher Scientific Inc., Waltham, MA, USA). The 260/280 nm ratio was detected to be between 1.9 and 2.1. The RNA integrity was also confirmed on 1% agarose gel electrophoresis. Total RNA (0.5 μ g) was used for reverse transcription with the PrimeScript RT Reagent Kit (Takara Bio Inc., Kusatsu, Japan) in a 20- μ L reaction volume according to the manufacturer's manual.

Primer design and RT-qPCR conditions

We conducted RNA-Seq of the 'Datong' LYD transcriptome. The cDNA samples from root, leaf, and flower bud of the 'Datong' landrace were sequenced with Illumina HiSeq[™] 2500 (Biomarker, Beijing, China) and an EST contig assembly was developed using homologous sequences from lily and garlic, both of which are also in the family Liliaceae (unpublished data). Primer sequences for all six candidate reference genes, 18S rRNA, 60S rRNA, UBQ, AP4, ACT, and TUB from previous studies [19-21] were used to BLAST the 'Datong' EST contig assembly to obtain corresponding homologous gene sequences in the LYD genome. New primers for these genes were designed using the Primer Premier 5 software (PREMIER Biosoft, Palo Alto, CA, USA) with the following criteria: primer length of 17-25 nucleotides, expected amplicon lengths of 80-150 bp, melting temperature (Tm) of 58-62°C, and GC content of 45-55%. All primers were synthesized commercially (Zoonbio Biotechnology, Nanjing, China) and tested by regular PCR. The amplicons were analyzed by 1.5% agarose gel electrophoresis before RT-qPCR. Standard curves (S2 Fig) using 5-fold dilution series of pooled cDNA were developed to calculate the PCR amplification efficiency (E) and the regression coefficient (R^2) of each primer pair [12]. For all six candidate reference genes, their species sources and Gen-Bank accession numbers of homologous genes, primer sequences, amplicon length, Tm (melting temperature), E (PCR amplification efficiency), and R^2 (regression coefficient of standard curve) are listed in Table 1.

RT-qPCR was carried out with the ABI prism 7500 Fast Real-time PCR system (Thermo Fisher Scientific Inc., Waltham, MA, USA) with the SYBR Green chemistry. Each reaction was performed in a 20- μ L volume including the following components: 1 μ L diluted cDNA template (0.1 mg. mL⁻¹), 10 μ L SYBR Premix Ex Taq II (Takara Bio Inc.), 0.4 μ L of ROX Reference Dye II (Takara Bio Inc.), 0.8 μ L each of forward and reverse primers (10 μ M), and 7 μ L ddH₂O. The reaction conditions were as follows: 95°C for 3 min, followed by 40 cycles of denaturation at 95°C for 30 s and annealing at 55°C for 30 s, and extension at 72°C for 1 min. The melting curve was obtained by heating the amplicon from 55°C to 95°C at increments of 0.4°C for 30 s. Each RT-qPCR analysis was performed with three technical replicates.

Gene	species source	e GeneBank accession # Primer sequences(forward reverse)		amplicon length (bp)	Amplicon Tm (°C)	E(%)*	R ² *
18S	Lilium formosanum	D29775	CAGACAAATCGCTCCACCAAC	200	59.0	98.7	0.999
			CGCAAGGCTGAAACTTAAAGG				
60S	<i>Lilium davidii</i> var. unicolor	KP861879	CGTCTTCCTATTCGCCAACC	90	60.9	101.2	0.997
			AGCACCGCCAAAGTCCAGTT				
UBQ	Lilium longiflorum	AF116772	CAGTAATGGCGATCAAAGTGG	86	58.8	102.3	0.998
			AAGGTGGTCAGGCTCAGGAA				
AP4	<i>Lilium davidii</i> var. unicolor	KP861878	ATTTCCTCCCTCTTCCTACCC	105	59.4	99.7	0.998
		unicolor	TGGACCTGCTGCGATGTTTAT				
ACT	Lilium regale	JX826390	GCAAGGAAATCACGGCACT	91	58.9	101.1	0.999
			GAACCTCCAATCCAAACACTGTAC				
TUB	Allium sativum	KP116310	CTTGAACCGGGTACGATGGA	110	60.0	97.5	0.999
			CCCTTGGCCCAATTATTCC				

Table 1. Candidate reference genes descriptions and primer sequences.

*E = PCR amplification efficiency of candidate reference genes.

 $*R^2$ = regression coefficient of standard curve for each candidate reference genes.

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Assessment of reference gene expression stability

Three common statistical software programs, geNorm [22], NormFinder [23], and BestKeeper [24], were employed to calculate and analyze the expression stability of six reference genes across different experimental samples. The comprehensive ranking of the stability of six reference genes was determined using RefFinder [25].

Raw RT-qPCR data were obtained using ABI prism 7500 software V2.3 (Thermo Fisher Scientific Inc.), and the cycle threshold (Ct) values were used to analyze the expression levels of candidate reference genes. For geNorm and NormFinder, raw Ct values were transformed into Δ Ct values, which have a maximum value of 0, while all other values are negative before calculation. The value of $2^{(\Delta Ct)}$ was calculated for every data point, and all data were assessed relative to the expression of the highest expressed data point. For geNorm, the expression stability value (M) of each reference gene was calculated based on the average pairwise variation among all tested genes; a lower M value represents higher gene expression stability [22]. For NormFinder, an ANOVA-based model of each reference gene was used to calculate the expression stability value by determining inter- and intra-group variation; in this analysis, the gene with the lowest value has the most stable expression [23].

The BestKeeper software program uses raw Ct values to calculate the stability of candidate reference genes. The expression stability of reference genes was analyzed using BestKeeper software based on the following three parameters: the standard deviation (SD), the percentage of covariance, and the correlation coefficient (r) [24]. Genes with SD values greater than 1 were considered unreliable for expression normalization. Reference genes with lower SD values are more stable and therefore more suitable for RT-qPCR [26].

The comprehensive ranking of reference genes was obtained by RefFinder using raw Ct values. Based on the rankings produced by other three programs, it assigns an appropriate weight to each gene and calculates the geometric mean of their weights to produce an overall final ranking [25]. The most stable LYD reference genes were then determined from the different experimental samples.

Validation of reference gene analysis

AOC3 and TAT are key enzyme-coding genes in the biosynthesis of alkaloids. Our transcriptome sequencing database showed that these two genes, designated as *HcAOC3* and *HcTAT* (the sequencing data were presented in S1 Text), respectively hereinafter, have high relative expression levels in roots of LYD (unpublished data). They were used as target genes to verify the stability of the reference genes for RT-qPCR. Through BLAST search, we identified the whole length cDNA sequences from 'Datong' transcriptome contig assembly. The relative expression levels of HcAOC3 and HcTAT in different organs of 'Datong' landrace plants were determined and normalized with the most and least stable reference genes according to geNorm, NormFinder, BestKeeper, and RefFinder results. Three biological replicates and technical replicates were adopted for each treatment. The leaf was used as the control sample. The cycle threshold (Ct) value of reference gene was subtracted from that of target gene to obtain a Δ Ct value. The Δ Ct value of leaf was subtracted from the Δ Ct value of root or flower to obtain a $\Delta\Delta$ Ct value. The fold changes in relative expression level to leaf were expressed as $2^{-\Delta\Delta$ CT[27]. The t-test statistics were generated from an ANOVA model by SASS program and characterized among-relative expression levels in the same organ sample when different reference genes were used. Primers design and qRT-PCR reactions were followed as mentioned before. The following primer pairs were used for RT-qPCR: 5'-CGTGACCCAAAGGTTGTGCT-3' (forward) and 5'-TGTTCCTGGTTCTAACTGCCTAC-3' (reverse) for HcAOC3 and 5'-TTGGAGA

CTTGGGTGGATGG-3' (forward) and 5'-TGAGGAACTGCTGCCTGAATAA-3' (reverse) for *HcTAT*.

Results

Verification of PCR amplicons and primer specificity

Agarose gel electrophoresis was used to examine the size of PCR amplicons, thereby ensuring that all primer pairs amplified fragments of the expected size (S3 Fig). Melting curve analysis also indicated that each primer pair amplified products corresponding to a single fragment (S4 Fig). As shown in Table 1, the amplification efficiencies (E) of RT-qPCR among all six reference genes varied from 97.5% for *TUB* to 102.3% for *UBQ*; the regression coefficients (R^2) ranged from 0.997 for 60S to 0.999 for 18S, ACT and TUB.

Expression profile of candidate reference genes

The Ct values of the six candidate reference genes detected by RT-qPCR are presented in Fig 2 with lower Ct value indicating higher expression level. Among the six genes, *18S* had the lowest Ct value across all samples. The six genes can be divided into two groups; group 1 including *18S*, *60S*, and *UBQ* with mean Ct values below 23 cycles suggesting relatively high expression levels; group 2 including *ACT*, *AP4*, and *TUB* with mean Ct values higher than 23 cycles



Fig 2. Box-whiskers plot showing Ct variation of six candidate reference genes in the LYD samples. (A) flower buds at different developmental stages of 'Datong' landrace; (B) different organs of 'Datong' landrace; (C) commercial flower buds of different landraces; and (D) all samples. The horizontal line within each box represents the median value. For each box, the upper and lower edges indicate the 25th and 75th percentiles, while whiskers represent the maximum and minimum values.

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indicating relatively low expression levels. The variation ranges (lower values represent less variability) of the six reference genes differed within experimental factors (Fig 2). For flower buds at different developmental stages, *18S* had the least variation (2.53 cycles), whereas *UBQ* had the most (5.15 cycles). Among the different organs, *60S* had the narrowest range of variation (1.73 cycles) while *AP4* had the widest range of variation (4.4 cycles). Among the commercial flower buds of different landraces, *UBQ* showed the least variation (2.11 cycles) and *ACT* showed the highest (4.88 cycles). Likewise, *TUB* was the most stable (3.76 cycles) while *UBQ* was the least (6.68 cycles) across all samples from three different experimental treatments.

Expression stability of all candidate reference genes

The raw Ct values of the six candidate reference genes exhibited a wide range of variations and did not represent the stability of genes accurately. Thus, it was necessary to use other statistical approaches for evaluating the results. As such, four programs (geNorm, NormFinder, Best-Keeper, and RefFinder) were used to determine the stability of the six candidate reference genes.

For geNorm, an M value below the threshold of 1.5 was used to identify reference genes as stably expressed. This was calculated using the average pairwise variation among all genes tested and subsequently ranking them according to the stepwise exclusion of the least stable gene. M values of all the tested reference genes in the samples from the different treatments are presented in Table 2 which were all lower than 1.5. *TUB* and *UBQ*, respectively, were the most and least stable genes among flower buds at different developmental stages, commercial flower buds of different landraces, and all samples from three different experimental treatments. Other genes with highly stable expression were *AP4* for flower buds at different developmental stages, *60S* and *ACT* among different organs, and *60S* for commercial flower buds of different landraces. Among different organs, *18S* was the least stable gene. When all samples were considered together, *ACT* exhibited the most stable expression.

The pairwise variation (V_n/V_{n+1}) was used to determine the optimal number of reference genes for normalization that were calculated by geNorm. The values were proposed to be less than 0.15 [28]. As shown in Fig 3, the pairwise variation of reference genes yielded a V_2/V_3 of 0.14 for samples from different organs and V_3/V_4 of 0.14 for samples from the commercial flower buds of different landraces. Therefore, 60S and ACT could be considered the most stable reference gene combination among the different organs; similarly, 60S, TUB, and AP4 was the best reference gene combination for achieving stable expression among the commercial flower

Among flowe differe development ('Dator	er buds at ent al stages ig')	Among different organs ('Datong')		Among commercial flower buds of different landraces		All samples	
Ranking	M*	Ranking	М	Ranking	М	Ranking	м
AP4	0.46	60S	0.45	60S	0.38	TUB	0.77
TUB	0.46	ACT	0.45	TUB	0.38	ACT	0.77
ACT	0.56	UBQ	0.47	AP4	0.52	AP4	0.83
18S	0.89	TUB	0.69	ACT	0.56	18S	1.13
60S	1.19	AP4	0.85	18S	0.72	60S	1.26
UBQ	1.38	18S	0.97	UBQ	0.83	UBQ	1.40

Table 2. Average expression stability values (M) for the six candidate reference genes in the LYD samples as calculated using the geNorm algorithm.

*M = stability value.

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buds of different landraces. However, all pairwise variation values of the reference genes for flower buds at different developmental stages and all samples were greater than 0.15. This indicated that at least five or more reference genes were needed for normalization of these two experimental conditions. But adding too many reference genes will increase the instability, and also the complexity of the experimental work [29]. Consequently, only one reference gene will be proposed to apply, resulting in accurate normalization.

The NormFinder analysis is based on an ANOVA model that considers intra- and intergroup variation to evaluate expression stability. The stability values of the six candidate reference genes were calculated by NormFinder under different experimental treatments (S1 Table). The NormFinder results were similar to those of geNorm. Expression levels of *AP4* among flower buds at different developmental stages, *ACT* among different organs, and *60S* among commercial flower buds of different landraces were the most stable reference genes with values of 0.18, 0.04, and 0.06, respectively. The maximum values for the stability of gene expression were for *60S* (0.28), *18S* (0.14), and *UBQ* (0.19). Among all samples, *AP4* and *18S* were the most and least stable reference genes, respectively (with values of 0.11 and 0.18). Additionally, *UBQ* (0.14) was more stable among all samples with NormFinder compared to the corresponding result obtained with geNorm.

The expression stability of the six candidate reference genes as analyzed using BestKeeper software indicated that 18S (0.64) and UBQ (1.23) were the most and least stable reference genes for flower buds at different developmental stages, respectively (S2 Table). Among different organs, ACT had the most stable expression (0.43) whereas AP4 had the least (1.03). Among commercial flower buds from different landraces, 60S (0.53) and ACT (0.84) showed the most and least stable expression, respectively. Among all three experimental treatments, TUB (0.62) was the most stable reference gene and UBQ (1.41) was the least stable reference gene, in accord with the resulted produced by geNorm.

The six candidate reference genes tested under the same condition were ranked using the analyses of the three statistical algorithms. The three programs inferred parallel trends, but there were some subtle differences in the specific rankings under each experimental condition. The discrepancies in rankings by different software for all samples were obvious; *AP4* and *18S* were, respectively the most and least stable reference gene using NormFinder, while the two genes exhibited intermediate stability for normalization according to geNorm and BestKeeper.

RefFinder was used to assess the overall aforementioned results and determine the comprehensive rankings of the six candidate reference genes (Table 3). Its algorithm integrates information from geNorm, NormFinder, and BestKeeper to compare and rank the tested candidate reference genes. Lower geometric means of the ranking values represent more suitable and stable reference gene. The analysis by RefFinder revealed that *AP4*, *ACT*, and *60S* exhibited the most stable expression among flower buds at different developmental stages (1.41), among different organs (1.00), and among commercial flower buds (1.00), respectively. However, *UBQ* and *18S* exhibited the least stable expression according to RT-qPCR results for samples under different experimental conditions. Among all samples, *TUB* was the most stable according to the comprehensive ranking, while *UBQ* was the least.

Reference gene validation

HcAOC3 and *HcTAT* are two key genes encoding enzymes in the alkaloid biosynthesis pathway, which may be related to alkaloid metabolism in LYD. Their relative expression among different organs in the 'Datong' landrace was used to evaluate and normalize the results obtained by the four statistical programs (Fig 4). Based on results from geNorm and RefFinder, two reference genes were suitable for normalization of different organs. So, four sets of reference genes were selected: the most stable reference genes (*ACT*, 60S, *ACT*+60S) and the least stable reference gene (*18S*) among different organs. As shown in Fig 4, when the most stable reference genes (*ACT*, 60S, and *ACT*+60S) were used for normalization, there was no significant difference in relative expression of *HcAOC3* and *HcTAT* among different organs. The most stably expressed reference genes exhibited similar expression levels. However, when *18S* was used as a reference gene, there was significant difference among the relative expression level in root (p < 0.05); and the differences of relative expression of *HcTAT* in root below the level in flower, this was not in conformity with the previous results.

Among flower buds at different developmental stages ('Datong')		Among different organs ('Datong')		Among commercial flower buds of different landraces		All samples	
Ranking	G*	Ranking	G	Ranking	G	Ranking	G
AP4	1.41	ACT	1.00	60S	1.00	TUB	1.00
18S	1.86	60S	1.68	TUB	1.68	ACT	2.66
TUB	2.06	UBQ	3.00	AP4	3.22	AP4	2.71
ACT	3.94	TUB	4.23	ACT	4.43	18S	3.13
60S	4.73	AP4	5.23	18S	5.00	60S	4.47
UBQ	6.00	18S	5.42	UBQ	5.05	UBQ	6.00

Table 3. Comprehensive rankings of the six candidate reference genes in the LYD samples based on the RefFinder software program.

*A lower geometric mean (geomean) of the ranking values represents more expression stability of the reference genes. G = Geomean of ranking values.

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Fig 4. Relative expression level of (A) *HcAOC3* and (B) *HcTAT* in different organs of 'Datong' landrace plants. The most or the least stable reference genes were used for analysis. The error bars represent standard errors, and *t*-test statistics were generated from an ANOVA model characterizing among-relative expression levels in the same sample. * *P* < 0.05.

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Discussion

RT-qPCR is one of the most common molecular biology research tools, and its reliability and accuracy strongly depends on appropriate normalization using stably expressed reference genes [30]. Although several reference genes have been proposed for two Liliaceae species *Lilium brownie* [13] and *Lilium davidii* var. *unicolor* [20], their usefulness in LYD was not known. Reference genes suitable for one species are not necessarily working for others, and there are no one-fit-all reference genes with constantly stable expression across all plants species [31]. Our results indicate that the expression stability of reference genes was affected by developmental stages, tissues, landraces, and physiological status, which emphasizes the necessity of selecting suitable reference genes for RT-qPCR.

Raw Ct values are the foundation for evaluating reference genes [32]. They directly reflect the expression levels of genes, to a certain degree [33]. Many studies have reported that the transcript levels of reference genes may affect the quantification of target genes in RT-qPCR experiments. The selected reference gene should have similar Ct values to those of the target genes. In our study, *TUB*, *AP4*, *ACT*, and *60S* had moderate Ct values (varying from 20 to 30) under all experimental treatments and thus meet the requirement for use as reference genes.

The software packages geNorm, NormFinder, and BestKeeper are three of the most widely used statistical software programs for evaluating reference genes, and they use different algorithms. The results obtained using the three programs were largely consistent, despite subtle differences owing to the various statistical algorithms they employ. Such subtle discrepancies were also observed in previous studies. In kiwifruit, BestKeeper showed that *ACT1* was one of the most stable reference genes, whereas geNorm indicated that *ACT1* was among the least stable [34]. Therefore, it is helpful to evaluate the results with multiple programs to obtain integrated results for candidate reference genes.

Information based on pairwise variation values calculated by geNorm is also useful. In this study, two and three reference genes were proposed for normalization in different landraces and organs of LYD. Due to the various experimental treatments, and number or type of tested candidate reference genes, the optimal number of reference genes is different. Considering that the variation in the average of multiple reference genes was smaller than the variation in individual reference gene, the normalization calculation based on the geometric mean of multiple reference genes provided more accurate and reliable normalization of expression data [35]. This situation were common in other plants, such as *Lilium davidii* var. *unicolor* [20], watermelon [36], *Daucus carota* [37] and melon [38]. Although a value of less than 0.15 was

proposed by this program, it should not be considered the must-follow criterion in selecting the optimal number of reference genes for RT-qPCR [39]. The balance between cost and accuracy of analysis should be taken into consideration [40]. Also, we used RefFinder to integrate results from geNorm, NormFinder, and BestKeeper. This program assigns an appropriate weight to tested genes and calculates the geometric mean of their weights using ranking information from the three programs. The comprehensive ranking by RefFinder made the selection of candidate reference genes reliable [41].

The target genes *HcAOC3* and *HcTAT* were examined to verify the expression stability of selected candidate reference genes in this study. Our LYD transcriptome sequencing study indicated that the two genes had high expression level in the root. However, there were conflicting results in the relative expression of *HcTAT* among different organs when *18S* was used for normalization. The relative expression of *HcAOC3* in root using *18S* also differed significantly when the most stable reference genes (*ACT*, *60S*, and *ACT*+*60S*) were used for normalization. Our result clearly suggested that the utilization of unstably expressed reference gene without validation may lead to biased results [42].

To summarize, from the present study, the combination of 60S, *TUB*, and *AP4* was appropriate for commercial flower buds of different landraces whereas *ACT* together with 60S was suitable for normalization under different organs. In addition, *AP4* exhibited the most stable expression in flower buds among different developmental stages. The relative expression analysis of target genes *HcAOC3* and *HcTAT* confirmed the correctness of these results using four statistical software programs. The stable reference genes identified in the current study collectively laid a solid foundation to analyze gene expression in *Hemerocallis citrina* Baroni. with RT-qPCR.

Supporting information

S1 Fig. Flowers of three different landraces. (TIF)

S2 Fig. Standard curves of the six candidate reference genes. (TIF)

S3 Fig. Specific PCR product for each gene were shown by 1.5% agarose gel electrophoresis. (TIF)

S4 Fig. Melt curves of six candidate reference genes showing single peak. (TIF)

S1 Table. Expression stability values for the six candidate reference genes in the LYD samples as calculated using the NormFinder algorithm. (PDF)

S2 Table. Standard Deviation (SD) for the six candidate reference genes in the LYD samples as calculated using the BestKeeper algorithm. (PDF)

S1 Text. The sequencing data of two target genes *HcAOC3* and *HcTAT*. (PDF)

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Author Contributions

Conceptualization: FFH SL GMX.

Data curation: FFH JYW.

Formal analysis: SL FFH YQW.

Funding acquisition: GMX SL.

Investigation: FFH SL YQW.

Methodology: YQW SL FFH.

Project administration: GMX.

Resources: XPK JYW.

Software: FFH.

Supervision: GMX YQW.

Validation: FFH XPK JYW.

Visualization: FFH SL YQW.

Writing - original draft: FFH.

Writing - review & editing: SL YQW GMX.

References

- 1. Hotta M, Ito M, Okada I. Differentiation and species relationships of island population of *Hemerocallis* around Kyushu, Japan. In: Hara H (ed) Origin and evolution of diversity in plants and plant communities. Academia Scientific Book Inc., 1985; pp:18–30.
- Lin SH, Chang HC, Chen PJ, Hsieh CL, Su KP, Sheen LY. The Antidepressant-like effect of ethanol extract of daylily flowers (Jīn Zhēn Huā) in rats. Journal of Traditional and Complementary Medicine. 2013; 3(1):53–61. https://doi.org/10.4103/2225-4110.106548 PMID: 24716156
- Du BJ, Tang XS, Liu F, Zhang CY, Zhao GH, Ren FZ, et al. Antidepressant-like effects of the hydroalcoholic extracts of *Hemerocallis Citrina* and its potential active components. BMC Complementary and Alternative Medicine. 2014; 14(1):1–11.
- Gu L, Liu YJ, Wang YB, Yi LT. Role for monoaminergic systems in the antidepressant-like effect of ethanol extracts from *Hemerocallis citrina*. Journal of Ethnopharmacology. 2011; 139(3):780–787. https://doi.org/10.1016/j.jep.2011.11.059 PMID: 22197914
- Venugopalan A, Srivastava S. Research review paper: Endophytes as *in vitro* production platforms of high value plant secondary metabolites. Biotechnology Advances. 2015; 33(6 Pt 1):873–887. https:// doi.org/10.1016/j.biotechadv.2015.07.004 PMID: 26225453
- Yuan JS, Galbraith DW, Dai SY, Griffin P, Stewart CN. Plant systems biology comes of age. Trends in Plant Science. 2008; 13(4):165–171. https://doi.org/10.1016/j.tplants.2008.02.003 PMID: 18329321
- Colebatch G, Trevaskis B, Udvardi M. Functional genomics: tools of the trade. New Phytologist. 2002; 153(1):27–36.
- 8. Bustin SA. Quantification of mRNA using real-time reverse transcription PCR (RT-PCR): trends and problems. Journal of Molecular Endocrinology. 2002; 29(1):23–29. PMID: 12200227
- Derveaux S, Vandesompele J, Hellemans J. How to do successful gene expression analysis using realtime PCR. Methods. 2010; 50(4):227–230. https://doi.org/10.1016/j.ymeth.2009.11.001 PMID: 19969088
- Chervoneva I, Li Y, Schulz S, Croker S, Wilson C, Waldman SA, et al. Selection of optimal reference genes for normalization in quantitative RT-PCR. BMC Bioinformatics. 2010; 11(1):1–15.
- Li W, Qian YQ, Han L, Liu JX, Li ZJ, Ju GS, et al. Validation of candidate reference genes for gene expression normalization in *Buchloe dactyloides* using quantitative real-time RT-PCR. Scientia Horticulturae. 2015; 197:99–106.

- 12. Bustin SA. Why the need for qPCR publication guidelines-The case for MIQE. Methods. 2009; 50 (4):217–226. https://doi.org/10.1016/j.ymeth.2009.12.006 PMID: 20025972
- Luo HL, Luo LP, Guan BC, Li EX, Xiong DJ, Sun BT, et al. Evaluation of candidate reference genes for RT-qPCR in lily (*Lilium brownii*). Journal of Horticultural Science & Biotechnology. 2014; 89(3):345– 351.
- Sun HP, Li F, Ruan QM, Zhong XH. Identification and validation of reference genes for quantitative realtime PCR studies in *Hedera helix* L. Plant Physiology and Biochemistry. 2016; 108:286–294. https:// doi.org/10.1016/j.plaphy.2016.07.022 PMID: 27474936
- Iffiu-Soltesz Z, Mercader J, Daviaud D, Boucher J, Carpene C. Increased primary amine oxidase expression and activity in white adipose tissue of obese and diabetic db-/- mice. Journal of Neural Transmission. 2011; 118(7):1071–1077. https://doi.org/10.1007/s00702-011-0586-9 PMID: 21298297
- Kim YB, Uddina MR, Kim Y, Park CG, Park SU. Molecular cloning and characterization of tyrosine aminotransferase and hydroxyphenylpyruvate reductase, and rosmarinic acid accumulation in *Scutellaria baicalensis*. Natural Product Communications. 2014; 9 (9):1311–1314. PMID: 25918800
- Riewe D, Koohi M, Lisec J, Pfeiffer M, Lippmann R, Schmeichel J, et al. A tyrosine aminotransferase involved in tocopherol synthesis in *Arabidopsis*. Plant Journal. 2012; 71(5):850–859. https://doi.org/10. 1111/j.1365-313X.2012.05035.x PMID: 22540282
- Wang MM, Toda K, Maeda HA. Biochemical properties and subcellular localization of tyrosine aminotransferases in Arabidopsis thaliana. Phytochemistry. 2016; 132:16–25 <u>https://doi.org/10.1016/j.</u> phytochem.2016.09.007 PMID: 27726859
- Soltis DE, Soltis PS, Chase MW, Mort ME, Albach D, Zanis M, et al. Angiosperm phylogeny inferred from 18S rDNA, rbcL, and atpB sequences. Botanical Journal of the Linnean Society. 2000; 133(4): 381–461.
- Li XY, Cheng JY, Zhang J, Teixeira da Silva JA, Wang CX, Sun HM. Validation of reference genes for accurate normalization of gene expression in *Lilium davidii* var. unicolor for real time quantitative PCR. PLoS ONE. 2015; 10(10):e0141323. https://doi.org/10.1371/journal.pone.0141323 PMID: 26509446
- Chen J, Li XX, Yuan X, Yi J, Luo X, Zhao Y, et al. Study on Molecular Detection and Elimination of Three Lily (*Lilium longiflorum*) Viruses. Journal of Agricultural Biotechnology. 2013; 21(4):489–497.
- Vandesompele J, Preter KD, Pattyn F, Poppe B, Roy NV, Paepe AD, et al. Accurate normalization of real-time quantitative RT-PCR data by geometric averaging of multiple internal control genes. Genome. 2002; 3 (7):1–11.
- 23. Andersen CL, Jensen JL, Ørntoft TF. Normalization of real-time quantitative reverse transcription-PCR data: a model-based variance estimation approach to identify genes suited for normalization, applied to bladder and colon cancer data sets. Cancer Reserch. 2004; 64(15):5245–5250.
- Pfaffl MW, Trichopad A, Prgomet C, Neuvians TP. Determination of stable housekeeping genes, differentially regulated target genes and sample integrity: Best Keeper-Excel-based tool using pair-wise correlations. Biotechnology Letters. 2004; 26(6):509–515. PMID: 15127793
- Xie FL, Xiao P, Chen DL, Xu L, Zhang BH. miRDeepFinder: a miRNA analysis tool for deep sequencing of plant small RNAs. Plant Molecular Biology. 2012; 80 (1):75–84.
- Xiao XL, Wu XM, Ma JB, Li PB, Li TT, Yao YN. Systematic assessment of reference genes for RTqPCR across plant species under salt stress and drought stress. Acta Physiologiae Plantarum. 2015; 37(9):186.
- Livak KJ, Schmittgen TD. Analysis of relative gene expression data using real-time quantitative PCR and the 2^{-ΔΔCT} method. Methods. 2001; 25: 402–408. https://doi.org/10.1006/meth.2001.1262 PMID: 11846609
- Gimeno J, Eattock N, Deynze AV, Blumwald E. Selection and validation of reference genes for gene expression analysis in switch grass (*Panicum virgatum*) using quantitative real-time RT-PCR. PLoS One. 2014; 9(3):e91474. PMID: 24621568
- 29. Kong F, Cao M, Sun P, Liu W, Mao Y. Selection of reference genes for gene expression normalization in *Pyropia yezoensis* using quantitative real-time PCR. J Appl Phycol. 2015; 27:1003–1010.
- **30.** Nolan T, Hands RE, Bustin SA. Quantification of mRNA using real-time RT-PCR. Nature Protocols. 2006; 1(3):1559–82. https://doi.org/10.1038/nprot.2006.236 PMID: 17406449
- Borowski JM, Galli V, Messias RDS, Perin EC, Buss JH, Silva SDDAE, et al. Selection of candidate reference genes for real-time PCR studies in lettuce under abiotic stresses. Planta. 2014; 239(6): 1187–1200. https://doi.org/10.1007/s00425-014-2041-2 PMID: 24573225
- Chen Y, Hu BY, Tan ZQ, Liu J, Yang ZM, Li ZH, et al. Selection of reference genes for quantitative realtime PCR normalization in creeping bentgrass involved in four abiotic stresses. Plant Cell Reports. 2015; 34(10):1825–1834. https://doi.org/10.1007/s00299-015-1830-9 PMID: 26179072

- Yan JW, Yuan FR, Long GY, Qin L, Deng ZN. Selection of reference genes for quantitative real-time RT-PCR analysis in citrus. Molecular Biology Reports. 2011; 39(2):1831–1838. https://doi.org/10.1007/ s11033-011-0925-9 PMID: 21633888
- Ferradás Y, Rey L, Martínez O, Rey M, Gonzalez MV. Identification and validation of reference genes for accurate normalization of real-time quantitative PCR data in kiwifruit. Plant Physiology and Biochemistry. 2016; 102:27–36. https://doi.org/10.1016/j.plaphy.2016.02.011 PMID: 26897117
- Kong QS, Yuan JX, Gao LY, Zhao LQ, Cheng F, Huang Y, et al. Evaluation of appropriate reference genes for gene expression normalization during watermelon fruit development. PLoS One. 2015; 10(6): e0130865. https://doi.org/10.1371/journal.pone.0130865 PMID: 26110539
- 36. Kong QS, Yuan JX, Gao LY, Zhao S, Jiang W, Huang Y, et al. Identification of suitable reference genes for gene expression normalization in qRT-PCR analysis in watermelon. PLoS One. 2014; 9(2): e90612. https://doi.org/10.1371/journal.pone.0090612 PMID: 24587403
- Campos MD, Frederico AM, Nothnagel T, Arnholdt-Schmitt B, Cardoso H. Selection of suitable reference genes for reverse transcription quantitative real-time PCR studies on different experimental systems from carrot (*Daucus carota* L.). Scientia Horticulturae. 2015; 186: 115–123.
- Kong QS, Yuan JX, Niu PH, Xie JJ, Jiang W, Huang Y, et al. Screening suitable reference genes for normalization in reverse transcription quantitative real-time PCR analysis in melon. PLoS One. 2014; 9(1): e87197. https://doi.org/10.1371/journal.pone.0087197 PMID: 24475250
- Marum L, Miguel A, Ricardo CP, Miguel C. Reference gene selection for quantitative real-time PCR normalization in *Quercus suber*. PLoS One. 2012; 7(4): e0035113.
- Expósito-Rodríguez M, Borges AA, Borges-Pérez A, Pérez JA. Selection of internal control genes for quantitative real-time RT-PCR studies during tomato development process. BMC Plant Biology. 2008; 8(1):443–447.
- Yang ZM, Chen Y, Hu BY, Tan ZQ, Huang BR. Identification and validation of reference genes for quantification of target gene expression with quantitative real-time PCR for tall fescue under four abiotic stresses. PLoS One. 2015; 10(3): e0119569. https://doi.org/10.1371/journal.pone.0119569 PMID: 25786207
- Wu JX, Su SY, Fu LL, Zhang YJ, Chai LJ, Yi HL. Selection of reliable reference genes for gene expression studies using quantitative real-time PCR in navel orange fruit development and pummelo floral organs. Scientia Horticulturae. 2014; 176(2):180–188.