ORIGINAL ARTICLE



Selection of reliable reference genes for gene expression analysis in seeds at different developmental stages and across various tissues in *Paeonia ostii*

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Abstract

Paeonia ostii seeds have recently been identified as a new source of α -linolenic acid in China. Studying the gene expression patterns of unsaturated fatty acid-related genes would be helpful for understanding the mechanism of α -linolenic acid accumulation. Quantitative real-time polymerase chain reaction (qRT-PCR) is a useful method for reliably evaluating gene expression, and it is necessary to select reliable reference genes for data normalization in qRT-PCR analysis. In this study, we evaluated the expression stability of 12 candidate reference genes using four mathematical algorithms (ΔC_t , BestKeeper, NormFinder, and geNorm). The web-based tool RefFinder was used to integrate the results and to provide a comprehensive ranking order. The expression stability ranking orders of reference genes were different caculated by these four algorithms, and the ranking order analyzed by the RefFinder was $UBQ > Tip41 > UCE > EF-1\alpha > \alpha$ - $TUB > PP2A > ACT > GAPDH > SAM > CYP > \beta$ -TUB > 18S at the different seed development stages, and $UBQ > Tip41 = UCE > EF-1\alpha > \alpha$ - $TUB > PP2A > UCE > GAPDH > SAM > ACT > CYP > 18S > \beta$ -TUB in *P. ostii* tissues. *UBQ* and *Tip41* are the two most stable whereas 18S and β -TUB are the two least stable reference genes for gene expression in various tissues and seeds at different developmental stages in *P. ostii*.

Keywords Paeonia ostii · Reference gene · Normalization · qRT-PCR · Seed development

Introduction

Tree peony (*Paeonia* section *Moutan* DC.), which is a perennial deciduous shrub native to China, is a well-known horticultural and medicinal plant [1]. In 2011, seeds of

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Paeonia ostii (P. ostii), which belong to a member of tree peony, were identified as novel sources of edible plant oil in China. The seed oil of this species is characterized by abundant unsaturated fatty acids (UFAs) and a high proportion of α -linolenic acid (ALA), which is a type of n-3 fatty acids with many health benefits [2, 3]. The UFA content in P. ostii seed oil exceeds 90% and contains approximately 42.78% ALA, 26.50% linoleic acid (LA) and 22.97% oleic acid (OA) [3, 4]. Consequently, P. ostii seed oil is recognized as an excellent health-promoting edible oil that has great potential economic value. To understand the molecular mechanism of UFA biosynthesis (especially ALA biosynthesis) in P. ostii seeds, transcriptomic analysis was performed during seed development, and numerous key candidate genes associated with UFA biosynthesis were identified [2]. Investigating the expression profiles of these candidate genes will greatly facilitate the understanding of gene function in seed oil biosynthesis.

Quantitative real-time polymerase chain reaction (qRT-PCR) has become the preferred method to quantify transcript abundance because of its high sensitivity, accuracy, specificity and reliability [5, 6]. However, its accuracy is strongly dependent on the constant transcriptional performance of reference genes (RGs), which are often referred to as housekeeping genes and are required for stable expression regardless of experimental conditions [7, 8]. A number of housekeeping genes, which typically encode proteins responsible for the maintenance of basic cellular structures and metabolism, such as glyceraldehyde-3-phosphate dehydrogenase (GAPDH), actin (ACT), 18S ribosomal RNA (18S), elongation factor 1 alpha (EF-1 α), ubiquitin-conjugating enzyme (UCE) and ubiquitin (UBQ), are common RGs used for gene expression analysis in many plant species [2, 8-10]. However, recent studies have found that there are expression variabilities of these RGs in different tissues, development stages and environmental conditions [7, 8, 11–14]. There are no universal RGs suitable for all experimental conditions. For example, ACT6, ACT8, and ACT7 were the best RGs for kumpuat under salt stress, drought stress and heavy metal stress conditions, respectively [11]. Protein phosphatase 2A subunit A3 (PP2AA3) and 18S were the most stably expressed genes in tea plant (Camellia sinensis) exposed to metal stress [13]. ACT and UCE were the most suitable RGs for normalization in Sacha inchi during the entire growth cycle [12]. Thus, it is important to select reliable RGs as internal controls under individual experimental condition to ensure reproducible and precise gene expression quantification.

In the last two decades, several prevalent mathematical algorithms have been used to identify appropriate RGs for qRT-PCR under different experimental conditions, such as the delta cycle threshold (ΔC_t) method [15], BestKeeper [16], geNorm [17], NormFinder [18], and RefFinder [19]. These methods have been used to evaluate candidate RGs in different plant species across different developmental stages, tissues and organs, biotic and abiotic stresses, including Arabidopsis, rice, potato, papaya, tea plant, and Sacha inchi, among others [8, 12-14, 20-22]. A previous study found that GAPDH and UCE were the two most stable RGs during flower development in 'Fengdan', which was the cultivated type originated from P. ostii [23]; however, suitable RGs during seed development and in various vegetative and reproductive tissues have not been identified for normalization of the expression levels of the genes specially involved in seed oil biosynthesis. In this study, we selected 12 candidate RGs (UBQ, 18S, ACT, α -tubulin (α -TUB), β -tubulin $(\beta$ -TUB), UCE, GAPDH, Protein phosphatase 2A (PP2A), Tip41-like protein (Tip41), S-adenosylmethionine synthetase (SAM), EF-1 α , Cyclophilin (CYP) and evaluated the stability of these 12 genes to identify the most suitable RGs for qRT-PCR data normalization in different tissues and seeds at different developmental stages. The reliability of the identified RGs was further validated by analyzing the expression pattern of fatty acid desaturase 2 (FAD2) gene during seed development and in different tissues in *P. ostii* using the stable and unstable genes for normalization. The results may be useful for selecting reliable RGs suitable for the accurate quantification of gene expression and gene function research in *P. ostii*.

Materials and methods

Plant materials

Five-year-old *P. ostii* plants were grown in a field at Zhoukou Normal University, Zhoukou City, Henan Province, China. The roots, stems, leaves, flowers, fruits (5 days after pollination) and seeds of three biological replicates of *P. ostii* plants were collected for experiments. The seeds at different developmental stages were collected at intervals of 10 days after pollination (DAP) until 120 DAP (containing mature seeds). All tissues prepared for qRT-PCR were immediately frozen in liquid N₂ and stored at -80 °C until use.

RNA extraction and cDNA synthesis

Total RNA was extracted from different *P. ostii* tissues using a TIANGEN RNA Prep Pure Plant kit (Tiangen Biotech Co. Ltd, Beijing, China) following the manufacturer's instructions. The RNA integrity, concentration and purity were examined using 1.2% agarose gel electrophoresis and a NanoDrop-2000C spectrophotometer (Thermo Fisher Scientific, USA). Isolated RNA samples, of which the A260/ A280 ratio was between 1.9 and 2.1, indicating high purity and no protein contamination, were used for further analysis. First-strand cDNA was synthesized with 0.7 μ g total RNA in a 20 μ L reaction volume using the PrimeScript[®] RT Reagent Kit with gDNA Eraser (TAKARA, Dalian, China) according to the manufacturer's instructions. All cDNA samples were diluted (1:5) with RNase-free water prior to use in qRT-PCR.

Selection of candidate reference genes and qRT-PCR primer design

A total of 12 *P. ostii* housekeeping genes were selected as candidate RGs for analysis in this study (Table 1). The cDNA sequences of these RGs were obtained from the National Center for Biotechnology Information (NCBI) nucleotide database (http://www.ncbi.nlm.nih.gov/nucle otide) from *Paeonia suffruticosa* (*P. suffruticosa*) and a transcriptome data (SRA accession number: SRP051810) from *P. ostii* submitted by Li et al. [2], and the gene information is shown in Table 1. The primer pairs used for qRT-PCR were designed based on selected sequences of the 12 candidate RGs using Primer Premier 5.0 and are listed in Table 1. To Molecular Biology Reports (2019) 46:6003–6011

 Table 1
 Primer sequences and amplification characteristics for 12 candidate reference genes and 1gene of interest

Gene/gene accession number	Gene name	Primer sequences (5'–3') forward/reverse	Amplicon length (bp)	Slope	Amplification efficiency (%)	Correlation coefficient	T_m (°C)
BQ/JN699053 Ubiquitin-like		GACCTATACCAAGCC GAAG/CGTTCCAGC ACCACAATC	122	-3.323	100.1	0.996	84
<i>18S</i> /U42792	18S ribosomal RNA	CCATAAACGATGCCG ACCAG/AGCCTTGCG ACCATACTCCC	109	-3.357	98.6	0.997	82
ACT/KU853024	Actin	TTTACTCACAGACCC GCCTC/GTGACACCA TCGCCTGAATC	170	-3.352	98.8	0.995	80
<i>α-TUB</i> /KU853025	α-tubulin	GCATTTGAGCCTTCT TCCAT/GTAGCCACA GCAGCATTGAC	119	-3.306	100.7	0.994	82
<i>β-TUB</i> /KU853026	β-tubulin	AATGCGGATGAGTGT ATGGT/ GAAGAAGTGAAGTCG TGGAA	210	-3.319	100.1	0.996	85
<i>UCE</i> /KU853027	Ubiquitin conjugating enzyme	ATTGGACCTCCCGAA ACTCT/TAGCCATTT GGGTCTTCACC	185	-3.232	103.9	0.998	82
<i>GAPDH</i> /KU853028	Glyceraldehyde-3-phos- phate dehydrogenase	AGGTGCTCCCATCCC TGAAT/ATCGGTTGA CACCACATCATCTTC	200	-3.331	99.6	0.996	82
<i>PP2A/</i> KU853029	Protein phosphatase 2A	TGATTACTTGCCCCT CACAGCC/CATAAC AGGTCGCACATT GGTC	150	-3.301	100.9	0.995	83
<i>TIP41</i> /KU853030	Tip41-like protein	AGTTGGTTTCTTCTC TTGCG/GACACTTGG ATCATTATATGCTG	200	-3.288	101.4	0.993	82
<i>SAM</i> /KU853031	S-adenosylmethionine synthetase	ATCTTCCACCTCAAC CCATCT/GCACCA CTCCTGTCCACCTT	164	-3.341	99.2	0.996	84
<i>EF-1α</i> /KU853032	Elongation factor 1α	ACTTCGTCTCCCACT TCAGG/AGCTTCATG GTGCATCTCAA	160	-3.333	99.5	0.999	82
<i>CYP/</i> KU853033	Cyclophilin	GTTCTTCATTACCTT GGCACCT/TGACCG TTGACCGTAGTA TCTT	161	-3.285	101.6	0.994	80
PoFAD2/KT153989	Fatty acid desaturase 2	CCATCTACTGGGCAC TACAA/GCCAACGGT GTCATCAAC	110	-3.328	101.1	0.993	82

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verify the sequences of the RGs, all the amplicons of the 12 candidate genes were analyzed on 1.5% agarose gels and sequenced.

qRT-PCR assay and data analysis

qRT-PCR was conducted using SYBR Premix Ex Taq (TaKaRa, Japan) on a CFX96 Real-Time System (Bio-Rad, USA). The reaction mixture (20 μ L) contained 2.0 μ L diluted cDNA, 10 μ L SYBR Premix Ex Taq, 0.5 μ L of each

of the forward and reverse primers (10 μ M), and 7 μ L PCRgrade water. The PCR program was as follows: 95 °C for 2 min; 40 cycles of 95 °C for 10 s, 58 °C for 15 s, and 72 °C for 15 s. The final melting curve was obtained between 65 and 95 °C to verify primer specificity. Each assay was carried out with three biological replicates and three technical replicates. To determine the amplification efficiency of each pair of primers, standard curves were generated from fivefold serial dilutions of cDNA samples from the seeds at 10 DAP. The values of PCR amplification efficiencies, slopes and correlation coefficients were obtained from the standard curves and were calculated using CFX ManagerTM software. The quantification cycle (Cq) values were also generated by this software and were used for the gene expression levels.

Four statistical algorithm programs, i.e. ΔC_t [15], Best-Keeper [16], geNorm [17], and NormFinder [18] were used to evaluate the stability of the candidate genes during seed development. A comparative web-based method, RefFinder (http://150.216.56.64/referencegene), was used to compare and integrate the comprehensive ranking order of the tested candidate RGs.

To verify the expression stability of the recommended candidate RGs, a *fatty acid desaturase 2* gene in *P. ostii* (*PoFAD2*), which is considered to be one of the key genes involved in UFA biosynthesis, was used as a target gene in the seeds at different stages and diverse tissue samples [2, 24]. The nucleotide sequence of *PoFAD2* was obtained from the NCBI database and the primers used in qRT-PCR were designed with the software Primer Premier 5.0 and are listed in Table 1. The qRT-PCR amplification conditions were the same as described above. The two most and least stable RGs, as determined by RefFinder, either alone or in combination (calculated by geometric mean) were used to normalize the expression level of *PoFAD2*, and the relative expression level of *PoFAD2* was calculated using the $2^{-\Delta\Delta Ct}$ method [25].

Results

PCR amplification efficiency and specificity

Twelve P. ostii housekeeping genes, which were obtained from a transcriptome data from P. ostii and the NCBI nucleotide database from P. suffruticosa, were selected as candidate RGs. Alignment results showed that all the RGs shared the identical sequences between P. ostii and P. suffruticosa. All the amplicons of the 12 candidate RGs were also sequenced, and we received the same results between sequences obtained from the test, the sequences from transcriptome data and the sequences in P. suffruticosa. These results indicated that the selected RGs among Paeonia species might very conservative. The gene names, abbreviations, accession numbers, primer sequences and amplicon length, amplification efficiency, correlation coefficient and melting temperature (Tm) values of the 12 candidate RGs are listed in Table 1. The amplicon size ranged from 110 to 210 bp, and the amplification efficiency of each primer pair varied between 98.6% for the 18S gene and 103.9% for UCE. In addition, all correlation coefficient values exceeded 0.99, and the Tm values ranged from 80 °C for CYP to 85 °C for β -TUB. Moreover, the melting curves for the amplified products of all 12 candidate RGs showed a single peak without peaks originated from the formation of primer dimers and amplification of nonspecific PCR products, corresponding to a specific melting temperature (Fig. 1).

Candidate reference gene expression profiles

The expression levels of candidate RGs during seed development and in various tissues in P. ostii were determined according to the Cq values obtained by qRT-PCR, and the mean Cq values of these RGs ranged from 10.02 to 33.98 (Table S1, Fig. 2). A low Cq value indicated a high gene expression level, and a high Cq value meaned a low gene expression level. There were wide differences in the transcript levels among these RGs. 18S and ACT were the most and least abundant transcripts in the tested P. ostii tissues, with Cq values ranging from 10.02 to 15.76, and 26.12 to 33.98, respectively (Table S1). The coefficients of variation (CV) of the 12 RGs in all samples were 2.68% (UBQ), 10.13% (18S), 5.73% (ACT), 5.86% (α -TUB), 7.12% (β -TUB), 5.33% (UCE), 7.10% (GAPDH), 5.57% (PP2A), 3.06% (Tip41), 6.64% (SAM), 4.31% (EF-1a) and 6.20% (CYP).

Stability analysis and ranking of reference genes

Four statistical algorithms were used to select the most suitable RGs during seed development and in different tissues of P. ostii, and the stability values of 12 RGs in seeds at different developmental stages and across various tissues were shown in Supplementary Tables S2 and S3, respectively. The two most stable RGs recommended by the four programs were consistent, whereas differences were observed for the least stable RGs (Table 2, Supplementary Tables S2 and S3). The $\Delta C_{\rm t}$ method evaluates the expression stability of candidate RGs based on the mean of standard deviation (SD), and the RG with the lowest SD is assumed to be the most stable gene. The BestKeeper program evaluates gene expression stability based on the CV and SD of the Cq values, and the most stable genes have the lowest CV and SD. NormFinder generates the stability values of RGs based on the inter- and intra-group variation in expression level, and lower values indicate higher stability. GeNorm software is a visual basic application tool to select an ideal pair of RGs and creates a stability ranking via the stepwise exclusion of the least stable genes. The stability value (M) of an RG is calculated based on the average pairwise variation between all RGs tested, and is inversely correlated with their exssion stability. Based on ΔC_t , NormFinder, GeNorm analysis, UBQ and Tip41 were the two most stable RGs during P. ostii seed development and in all tissues, while 18S and β -TUB were identified as the least most stable RGs (Table 2, Supplementary Tables S2 and S3). Based on BestKeeper analysis, as shown in Table 2, Supplementary Tables S2 and S3, UBQ



Fig. 1 Melting curves with a single peak for the 12 candidate reference genes



Fig.2 The quantification cycle (Cq) values of the 12 candidate reference genes in seed samples (a) and all tissue samples (b). Lines across the box-plot graph of the Cq values represent the median



value. The boxes indicate the 25th and 75th percentiles, and the whisker caps represent the maximum and minimum values

and *Tip 41* were ranked as the two most stable RGs in *P. ostii* seed and in all tissues, which was consistent with the results from the three other software analyses. However, *CYP* and β -*TUB* exhibited low stability and were ranked as the least stable RGs, which was different from the results analyzed by the three other algorithms. GeNorm program was also used

to analyze pairwise variation (Vn/Vn + 1) for the assessment of the optimal number of RGs required for reliable normalization. A threshold Vn/Vn + 1 value of 0.15 was adopted to determine whether it is necessary to introduce n + 1 RGs as the internal control. As shown in Supplementary Fig. S1, values (V2/3) lower than the recommended threshold of 0.15

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Method	Kanking order (better-good-average)											
	1	2	3	4	5	6	7	8	9	10	11	12
Seeds at differe	nt stages			·			·					
Delta CT	UBQ	Tip41	UCE	$EF-1\alpha$	α -TUB	ACT	PP2A	GAPDH	SAM	CYP	β -TUB	18S
BestKeeper	UBQ	Tip41	$EF-1\alpha$	UCE	α -TUB	PP2A	SAM	ACT	GAPDH	18S	CYP	β -TUB
NormFinder	UBQ	Tip41	UCE	$EF-1\alpha$	α -TUB	ACT	PP2A	GAPDH	SAM	CYP	β -TUB	18S
GeNorm	UBQ/Tip41		PP2A	GAPDH	α -TUB	ACT	UCE	$EF-1\alpha$	СҮР	SAM	β -TUB	18S
RefFinder	UBQ	Tip41	UCE	EF-1α	α -TUB	PP2A	ACT	GAPDH	SAM	CYP	β -TUB	18S
All tissues												
Delta CT	UBQ	Tip41	$EF-1\alpha$	α -TUB	UCE	PP2A	GAPDH	ACT	SAM	СҮР	β -TUB	18S
BestKeeper	UBQ	Tip41	$EF-1\alpha$	18S	UCE	SAM	PP2A	α -TUB	GAPDH	ACT	CYP	β -TUB
NormFinder	UBQ	Tip41	$EF-1\alpha$	α -TUB	UCE	SAM	PP2A	GAPDH	ACT	CYP	β -TUB	18S
GeNorm	UBQ/Tip41		PP2A	GAPDH	α -TUB	CYP	ACT	UCE	EF-1α	SAM	β -TUB	18S
RefFinder	UBQ	Tip41	EF-1α	α -TUB	PP2A	UCE	GAPDH	SAM	ACT	СҮР	18S	β -TUB

Table 2 Stability ranking of candidate reference genes in seeds at different developmental stages and across diverse tissue samples

indicated that two RGs were sufficient for the normalization of gene expression during seed development and across diverse tissues in *P. ostii*.

Finally, the RefFinder tool was used to integrate the above mentioned statistical algorithms and calculate the recommended comprehensive ranking order. The comprehensive ranking order is shown in Table 2, and the ranking order of expression stability was UBQ > Tip41 > UCE > EF- $1\alpha > \alpha$ - $TUB > PP2A > ACT > GAPDH > SAM > CYP > \beta$ -TUB > 18S at the different seed development stages, and UBQ > Tip41 > EF- $1\alpha > \alpha$ - $TUB > PP2A > ACT > GAPDH > SAM > CYP > \beta$ - $UCE > GAPDH > SAM > ACT > CYP > 18S > \beta$ -TUB in *Paeonia ostii* tissues. The result analyzed by RefFinder was similar to those of the ΔC_t method, geNorm and NormFinder algorithm, but there were some differences in the orders of the middle ranking RGs.

Validation of selected reference genes

To assess the reliability of the selected RGs, the relative expression pattern of the target gene, PoFAD2, which encodes the enzyme that is essential for UFA biosynthesis in P. ostii, was calculated in seeds at different developmental stages and various tissue samples by qRT-PCR. The primer specificity of PoFAD2 was verified as described for RGs (Table 1). The two most stable RGs (*UBQ* and *Tip41*) and the two least stable RGs (18S and β -TUB) identified by RefFinder were used either independently or in combination to normalize the expression levels of PoFAD2 (Fig. 3). Irrespective of normalization by UBQ or Tip41, alone or in combination, approximately the same expression patterns of PoFAD2 were obtained (Fig. 3a). PoFAD2 was predominantly expressed in seeds at the 10-100 DAP stages with the highest expression level at the 70 DAP stage. For other different tissues samples except seed samples, PoFAD2 was found to be mainly expressed in flowers. However, the expression patterns of PoFAD2 were different when using 18S or β -TUB alone or in combination as RGs for normalization (Fig. 3b). During seed development in *P. ostti*, the highest expression level of PoFAD2 appeared at the 80 DAP stage using β -TUB as the RG for normalization, and at the 90 DAP stage using either 18S alone or in combination with β -TUB for normalization, respectively (Fig. 3b). In addition, the expression pattern of PoFAD2 in various tissues was different when using these two least stable RGs alone or in combination for normalization (Fig. 3b). In addition, when stable RGs were used for normalization, significant differences in the expression levels of PoFAD2 were detected in seeds at 40-90 DAP in comparison with the expression levels in roots, which was used as a calibrator (Fig. 3a). On the other hand, significant differences (P < 0.001, P < 0.01) and no significant difference (P > 0.05) in *PoFAD2* gene expression were found between roots and seeds at 40 DAP when 18S, $18S + \beta$ -*TUB* and β -*TUB* used for normalization, respectively. These results revealed that significant differences in the PoFAD2 expression profiles depending on the RGs used for normalization of the qPCR data, whether stable or unstable. Taken together, these results demonstrate that choosing reliable RGs is important for accurate normalization in qRT-PCR experiments.

Discussion

The accuracy and reliability of gene expression patterns using qRT-PCR technology strongly depend on the use of stable RGs for normalization, which can remove non-biological variations [11, 26]. Previous studies revealed that there were no universal RGs among different plant species, and common RGs, such as *ACT*, *GAPDH* and *18S*, exhibited



Fig. 3 Relative expression of the *fatty acid desaturase 2* gene in diverse tissue samples using selected reference genes, including the most (**a**) and least (**b**) stable reference genes, for normalization in *Paeonia ostii*. The seed samples were collected at different developmental stages (10, 20, 30, 40, 50, 60, 70, 80, 90, 100, 110 and

120 days after pollination). Each data point represents the mean \pm SD of three replicates. Student's *t* test was used to determine significant differences from root (calibrator). Significance level: **P<0.01, ***P<0.001

expression variation in different plants under different developmental or experimental conditions [12, 27]. Therefore, the selection of reliable RGs for specific developmental or experimental conditions is important in qRT-PCR analysis.

The seed of *P. ostii* is considered as a new source of ALA in oil production, and studying the mechanism of lipid biosynthesis and the accumulation of ALA during *P. ostii* seed development has recently received considerable attention. However, suitable RGs in *P. ostii* seed development have not been identified. In this study, we selected 12 candidate RGs to evaluate their expression stability during seed development and also calculate its stability in different tissues in *P. ostii*. Four statistical methods (ΔC_t , Best-Keeper, NormFinder, and geNorm) were used to calculate

the stability of gene expression levels. In addition, a webbased tool (RefFinder) was used to integrate the results of these four algorithms and to provide a comprehensive ranking order of all 12 RGs. All four algorithms revealed that *UBQ* and *Tip41* were the two most stable genes among these 12 candidate RGs, but the least stable genes analyzed by these four methods differed (Table 2). The most stable RG ranked by RefFinder was also *UBQ* (Table 2), which is involved in protein degradation and was also identified as the most stable RG in *Platycladus orientalis* under NaCl and ABA treatment [28], across different tissues of *Rhododendron micranthum* Turcz [29], and across all organs and treatments of white clover [26]. However, *UBQ* is also considered to be inappropriate RG in some plant species. For example, UBO was unsuitable for normalization in Suaeda aralocaspica under different salt treatments [27]. The 18S gene, which forms part of the eukaryotic ribosome and has been exploited as a reference gene for a long time, was calculated to be the least stable RG by ΔC_{i} , NormFinder, geNorm and RefFinder (Table 2). Previous studies also found that the 18S gene was the worst RG for normalizing gene expression levels in many plant organs and under different conditions, such as *Lilium davidii* [30], Sacha inchi [12], Chinese tallow [31], Oxytropis ochrocephala Bunge [32] and rubber trees [33]. In contrast, 18S has been demonstrated to be a stable RG in strawberry [34] and rice [21]. In previous study, *Tip41*, one of the most stable RGs in our study, also showed high stability in the different cultivars of tree peony during flower development, and β -TUB was identified as one of the least stable RG [23], which was similar to the results in our study. It indicated the stability of *Tip41* and β -*TUB* might display consistent trends among Paeonia section Moutan DC cultivars and tissues. These results prove that the most suitable RGs differ among different plant cultivars, plant tissues and under different conditions and it is very important to select reliable RGs according to the specific experiment.

To test the reliability of the selected RGs, the expression pattern of *PoFAD2*, which encodes a key enzyme in UFA synthesis, was evaluated in this study. The *PoFAD2* expression patterns were similar when the gene expression data were normalized using the most stably expressed RGs (UBQ and Tip41) either alone or in combination, with the highest expression level of *PoFAD2* appearing at the 70 DAP stage (Fig. 3a). However, the expression patterns of *PoFAD2* differed using the least stable RGs (Fig. 3b). For example, the highest expression level of PoFAD2 was observed at the 80 DAP stage using β -TUB as the RG for normalization, and at the 90 DAP stage using either 18S alone or in combination with β -TUB for normalization, respectively. Interestingly, our results showed significant differences in the PoFAD2 expression profiles depending on the RGs used for normalization, whether stable or unstable. The main divergences were observed in the sample of seeds at 40 DAP in comparison with the expression levels in roots (Fig. 3). Therefore, the preliminary requirement for obtaining accurate relative gene expression levels is the use of suitable RGs.

In conclusion, this study evaluated the expression stability and determined the comprehensive rankings of 12 candidate RGs during *P. ostii* seed development and is diverse tissue samples using four statistical algorithms (ΔC_t , BestKeeper, NormFinder, and geNorm) and one web-based method (Ref-Finder). *UBQ* and *Tip41* were identified as the two most reliable RGs for qRT-PCR, whereas the least stable RGs were *18S* and β -*TUB*. The results obtained in this study provide useful information for accurate qRT-PCR data normalization in *P. ostii* gene expression studies.

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Author contributions CL and LH designed research; CL, LH, XW, HL, HT and JW performed experiments. CL and LH wrote the paper.

Compliance with ethical standards

Conflict of interest All authors declare that they have no conflicts of interest.

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