RESEARCH Open Access

Selection and validation of reference genes for quantitative expression analysis of miRNAs and mRNAs in Poplar

Fang Tang^{1,2†}, Liwei Chu^{1†}, Wenbo Shu^{1,3}, Xuejiao He¹, Lijuan Wang^{1,2} and Mengzhu Lu^{1,2*}

Abstract

Background: Quantitative reverse transcriptase polymerase chain reaction (qRT-PCR) is a rapid and sensitive approach to identify miRNA and protein-coding gene expression in plants. However, because of the specially designated reverse transcription and shorter PCR products, very few reference genes have been identified for the quantitative analysis of miRNA expression in plants, and different internal reference genes are needed to normalize the expression of miRNAs and mRNA genes respectively. Therefore, it is particularly important to select the suitable common reference genes for normalization of quantitative PCR of miRNA and mRNA.

Results: In this study, a modified reverse transcription PCR protocol was adopted for selecting and validating universal internal reference genes of mRNAs and miRNAs. Eight commonly used reference genes, four stably expressed novel genes in *Populus tremula*, three small noncoding RNAs and three conserved miRNAs were selected as candidate genes, and the stability of their expression was examined across a set of 38 tissue samples from four developmental stages of poplar clone 84K (*Populus alba* × *Populus glandulosa*). The expression stability of these candidate genes was evaluated systematically by four algorithms: geNorm, NormFinder, Bestkeeper and DeltaCt. The results showed that *Eukaryotic initiation factor 4A* III (*EIF4A*) and *U6-2* were suitable for samples of the callus stage; *U6-1* and *U6-2* were best for the seedling stage; *Protein phosphatase 2A-2 (PP2A-2)* and *U6-1* were best for the plant stage; and *Protein phosphatase 2A-2 (PP2A-2)* and *Oligouridylate binding protein 1B (UBP)* were the best reference genes in the adventitious root (AR) regeneration stage.

Conclusions: The purpose of this study was to identify the most appropriate reference genes for qRT-PCR of miRNAs and mRNAs in different tissues at several developmental stages in poplar. *U6-1*, *EIF4A* and *PP2A-2* were the three most appropriate reference genes for qRT-PCR normalization of miRNAs and mRNAs during the plant regeneration process, and *PP2A-2* and *UBP* represent the best reference genes in the AR regeneration stage of poplar. This work will benefit future studies of expression and function analysis of miRNAs and their target genes in poplar.

Keywords: Reference genes, MicroRNAs, mRNAs, gRT-PCR, Normalization, Development, Poplar

Introduction

Given its high sensitivity, quantitative accuracy, low cost and specificity, quantitative reverse transcriptase polymerase chain reaction (qRT-PCR) has become the

most common and widely used technique for quantifying miRNA expression and mRNA transcript levels among different tissues and experimental conditions in plants [1, 2]. However, the accuracy of qRT-PCR is easily affected by several factors, including the quality of RNA samples, reverse transcription efficiency, cDNA quality and amount, and differences in extraneous tissue and cell activities [2–4]. To avoid bias in qRT-PCR analysis, validation of suitable reference genes for data normalization is an elementary prerequisite for each

Full list of author information is available at the end of the article



^{*}Correspondence: lumz@caf.ac.cn

[†]Fang Tang and Liwei Chu contributed equally to this work

¹ State Key Laboratory of Tree Genetics and Breeding, Key Laboratory of Tree Breeding and Cultivation of the National Forestry and Grassland Administration, Research Institute of Forestry, Chinese Academy of Forestry, Beijing 100091, China

Tang et al. Plant Methods (2019) 15:35 Page 2 of 15

experimental condition in different tissues or species [5]. However, no single reference gene can be universal under all experimental situations, even including the most stable reference gene(s) reported [6, 7]. Therefore, optimal reference genes should be validated for different species, tissues or specific treatments.

MicroRNAs (miRNAs) are endogenous ~ 22 nt small noncoding RNAs that guide the cleavage or repress the translation of their target mRNAs by approximate basepairing rules [8, 9] or mediate mRNA decay by directing rapid deadenylation of mRNAs [10]. In plants, miR-NAs are master regulators in controlling developmental processes and in response to biotic and abiotic stress responses [11–15]. Due to its short sequence (only ~ 22 nt in length), the quantification of miRNAs by qRT-PCR requires extending the length of mature miRNAs using stem-loop primers [7, 16] or adding poly(A)-tails [17-20]. This extension requirement causes different internal reference genes to be commonly used for normalization in qRT-PCR of miRNAs and mRNAs. Some housekeeping genes, such as actin 7 (ACT 7), eukaryotic initiation factor 4A III (EIF4A), polyubiquitin (UBQ), glyceraldehyde-3-phosphate dehydrogenase (GAPDH) and protein phosphatase 2A-2 (PP2A-2), were widely adopted for gene expression analysis in diverse plants as reference genes [21-23]. Several noncoding RNA and small RNA, such as 5.8S ribosomal RNA (5.8S rRNA) and U6 small nuclear RNA (U6 snRNA), are commonly used as reference genes for miRNA quantity [24, 25]. Hurteau developed a modified universal reverse transcription PCR protocol, in which mature miRNAs could be polyadenylated by poly (A) polymerase and reverse transcribed into cDNA using oligo-dT primers [17]. Then, mRNAs and miRNAs could be specifically amplified and quantified at same transcriptional level, and the relative quantification of a miRNA and its predicted mRNA target can be both assessed precisely [17]. In this case, it is particularly important to select a suitable reference gene for normalization in quantitative PCR of miRNA and mRNA.

As a typical model woody plant, *Populus* has many advantages in basic research, such as rapid and perennial growth, moderate genome size, biomass-related traits and facile transformation [26]. Completion of the genomic sequence for *Populus trichocarpa* (black cottonwood) [27] has led to the development of genomic and molecular resources, and the ideal genetic transformation system provides a powerful genetic analysis tool for dissecting adaptive traits in poplar [28, 29]. Poplar clone 84K (*Populus alba* × *Populus glandulosa*) is now commonly used for gene functional studies because it is easier to obtain transgenic plants through *Agrobacterium tume-faciens*-mediated leaf discs [30–32]. The regeneration of

transgenic plants involves callus induction, shoot differentiation, seedling culture and plant growth. This process is time consuming, requiring 2–3 months for tissue culture seedling and approximately 3–4 months for plant growth in soil. Therefore, we perform transgenic identification and gene expression analysis of early regenerated shoots and/or roots even small seedlings to reduce the time for identifying gene function in transgenic plants. In addition, the expression levels of miRNAs or target genes in different tissues are also required for analysis between transgenic and normal plants. However, most miRNA and mRNA expression levels vary greatly in different developmental stages and tissues, so it is necessary to identify a more stably expressed miRNA or gene as the internal reference to normalize expression using qRT-PCR.

In this study, we have tested 18 genes and noncoding RNAs for candidate reference genes. The expression stability of these genes was validated across a set of 38 tissue samples from four developmental biological processes of 84K poplar using a modified universal reverse transcription PCR protocol [17]. The cycle threshold (Ct) values of candidates were used to evaluate the expression stability using four algorithms: geNorm, NormFinder, Bestkeeper and DeltaCt. *U6-1*, *EIF4A* and *PP2A-2* were the top three most appropriate reference genes for qRT-PCR of miR-NAs and mRNAs (including miRNA target genes) during the plant regeneration process, and *PP2A-2* and *UBP* were the best combination as reference genes in the AR regeneration stage of poplar.

Results

Verification of amplification and efficiency of the primers

A total of 12 protein-coding genes and 6 small noncoding RNAs were used as candidate reference genes for quantitative detection of miRNAs and mRNAs. The qRT-PCR primer sequences and amplicon characteristics of these candidate genes in 84K poplar are presented in Table 1. The PCR amplification specificities were confirmed by melting curves (Additional file 1: Fig. S1), agarose gel electrophoresis (Additional file 1: Fig. S2) and sequencing (Additional file 2: Fig. S3), which demonstrated the specific product of expected size and sequence. The qRT-PCR products ranged from 49 to 147 bp, and the sequence similarity between 84K poplar and Populus trichocarpa ranged from 97 to 100% despite belonging to different species. Therefore, the primers of these reference genes could also be used in other poplar species. To evaluate the amplification efficiency of pair-primers, the standard curves were obtained using a set of 10-fold diluted cDNA templates. The amplification efficiency (E) of the 18 candidate reference genes ranged from 96.16 to 116.69% and Tang et al. Plant Methods (2019) 15:35 Page 3 of 15

Table 1 The description of candidate reference genes and primers used in this study

Gene symbol	Gene name	Gene ID	Arabidopsis homolog	Forward primer sequence (5'-3')	Reverse primer sequence (5'-3')	Size (bp) 136	E (%) 100.02	R² 0.998
ACT7	Actin 7	Potri.001G309500	AT5G09810	GCATCCACGAGA CTACATACAACT CA	GTGATCTCCTTGCTC ATTCGGTCA			
EIF4A	Eukaryotic initiation Potri.005G09 factor 4A		AT3G19760	TACATTCATCGAATT GGTCGTTCTGGT	TTCATAGGCATTTCG TCAATCTGGG	137	101.50	0.995
GAPDH	Glyceraldehyde- 3-phosphate dehydrogenase	Potri.012G094100	AT1G13440	AACCGACTTCAT TGGTGACAACCG	CCACTCATTGTCATA CCACGCAAC	106	100.72	0.997
Histone	Histone superfamily protein	Potri.005G072300	AT4G40030	ACTGTTGCTCTTCGT GAAATCCGTA	CTTAAAATCCTG GGCAATTTCACG AAC	105	96.62	0.998
PP2A-2	Protein phosphatase 2A-2	Potri.015G068300	AT1G10430	ACAGTTCAACCA CACTAATGGGCTC	TTTGGCGCACTG AACACTGTAACC AC	114	103.41	0.988
PP2A-A2	Protein phosphatase 2A subunit A2	Potri.010G127500	AT3G25800	ATGAATTTCCTGATG TGCGACT	CAATGCCTATCCTCT GCAAGCTC	127	99.23	0.998
RPS18	Ribosomal protein S18	Potri.006G170500	AT1G07210	AGGCTCATCATCTTA TCAAATCCCT	TCAATGCCACCAAAT ATTCGTTGCT	127	103.69	0.990
UBQ10	Polyubiquitin 10	Potri.001G418500	AT4G05320	GTTGATTTTTGCTGG GAAGC	GATCTTGGCCTT CACGTTGT	192	98.18	1.000
ATPase	ATP synthase subunit B	Potri.004G177500	AT4G38510	ACTCATCCCACCCCT GATCTTACGG	ACCAATGGCACT CTTCATGAGACGA	138	101.65	0.995
UBP	Oligouridylate bind- ing protein 1B	Potri.006G279600	AT1G17370	GGCTTTGTTTCATTC CGTAATCAGCA	AACACCTTTAGT TGCCCAATTGCAT	111	100.92	0.978
bHLH	bHLH transcription Potri.011G132400 factor		AT5G54680	ATCTGAATCGTGTAG TGCGTCTAGCTC	GCATCAACCAAA ATAGCAGCCTTG TCC	147	101.61	0.985
DNAJ	DNAJ homologue 2	Potri.010G243100	AT5G22060	AGGCAATTAATG ACAAGGACCGTT	AGCCTCTCCAGG GAAAGTAATCCTC	131	101.98	0.996
U6-1	Small nuclear ribonucleoprotein family protein	Potri.001G166600	AT3G14080	GTGACCTTTATTGCG ACATCCACT	CTTCTGAAACAC GAGTCATATGTG GT	123	96.16	0.995
U6-2	Small nuclear ribonucleoprotein family protein	Potri.008G078400	AT2G43810	GCCTGTTGTGGT TAAGCTCAATTC TG	TTCCTCGTATGAAAG CATCACCAT	149	99.12	0.999
5.8s	5.8S ribosomal RNA gene	AJ006440		ACGTCTGCCTGG GTGTCAC	TCAACCACCGCT CGTCGTG	145	108.37	0.993
miR171	MIMAT0001985	ptc-miR171c		AGATTGAGCCGC GCCAATATC	AACGAGACGACG ACAGACTTT	49	107.44	0.967
miR403	MIMAT0002056	ptc-miR403a		CGCGTTAGATTC ACGCACAAACTC	AACGAGACGACG ACAGACTTT	57	115.04	0.982
miR482	MIMAT0002103	ptc-miR482a.1		CCTACTCCTCCCATT CCAAAA	AACGAGACGACG ACAGACTTT	50	116.69	0.941

the regression coefficient (R^2) varied between 0.941 and 1.000 (Table 1). These results suggest that the primers of all the candidate reference genes exhibit high amplification efficiency and specificity in the qRT-PCR system.

Expression profile of candidate reference genes during plant regeneration

To evaluate the stability of the reference genes across all experimental samples, the transcript abundance of the 18

candidate reference genes was assessed based on mean Ct values. The average Ct values for the 18 candidate reference genes ranged from 21 to 33, with most values between 26 and 27 across all samples. miR482 had the highest expression level with a Ct value of 20.65 cycle, whereas UBP was the lowest abundantly expressed gene with Ct values up to 31.47 (Fig. 1). The Ct values of EIF4A (26.50 \pm 0.55) and U6-2 (27.27 \pm 0.59) with minimum SD data indicate that these genes are the most stable genes in all the samples. The next most stable genes include

Tang et al. Plant Methods (2019) 15:35 Page 4 of 15

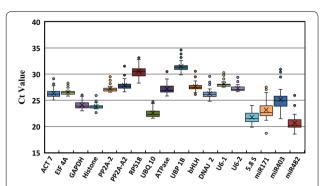


Fig. 1 Box plots of the Ct values of 18 candidate reference genes during plant regeneration. The box indicates the 25th and 75th percentiles, and the whisker caps represent the maximum and minimum values. The line across the box indicates the median, and the cross depicts the mean

Histone (23.83 ± 0.62) and U6-1 (28.07 ± 0.62) . Genes with more variable expression levels include miR403 (25.16 ± 2.29) and miR171 (23.16 ± 2.00) (Additional file 3: Table S1).

Expression stability of candidate reference genes during plant regeneration

To detect the expression stability of 18 candidate reference genes more accurately, four software programs, including geNorm, NormFinder, BestKeeper and Delta-Ct method, were used for statistical analysis. These candidate reference genes were evaluated by each program and ranked from the most to the least stably expressed genes. Then, the geometric mean of each gene was calculated and reordered using RankAggreg software. Data of each reference gene from samples of different developmental stages were analyzed separately and then integrated together.

The M-values of 18 candidate reference genes calculated by geNorm were all less than 1.5 in different tissues at plants developmental stages. U6-1 and U6-2 exhibited the highest stable expression with least M-values of 0.064 (Fig. 2a) and 0.082 (Fig. 2b) at the callus and seedling stage, respectively. PP2A-2 and U6-1 both exhibited the highest stable expression with the lowest M-value of 0.1456 at the plant stage (Fig. 2c), and EIF4A and U6-1 exhibited the lowest M-value at 0.236 in all samples of these three stages (Fig. 2d). Overall, U6-1 and EIF4A could be chosen as the most sable reference genes because of their lower M-value in various tissues at different developmental stages, whereas miR403 and miR171 were the least stable genes with increased M-values (from 0.577 to 0.955) in all samples. In the subsets of different developmental stages, all the pairwise variation values of V2/3 were less than 0.15, which suggests that the combined use of the two most stable reference genes would be most effective for normalizing gene expression analysis (Fig. 3).

The stability values of the candidate reference genes constructed by NormFinder are presented in Table 2. At the callus stage, *Histone* was the most stable gene with the lowest stability value followed by *EIF4A* and *U6-2*. *U6-1*, *U6-2* and *EIF4A* exhibited more stable expression at the seedling stage, whereas *UBP*, *bHLH* and *DNAJ* exhibited increased stability in various tissues at the plant stage. In all samples, *bHLH*, *PP2A-2* and *U6-1* were the top three stable genes. miR403, miRN482 and miR171 were the least stable genes during the plant regeneration process.

The most stable genes based on BestKeeper analysis exhibiting the lowest CV \pm SD were EIF4A (0.28 \pm 0.07), Histone (1.14 \pm 0.27) and EIF4A (1.63 \pm 0.43) in various tissues at the callus, seedling and plant stages, respectively (Table 3). U6-1 and U6-2 exhibited stable expression during all these developmental stages. In all samples, EIF4A (1.39 \pm 0.37) was the most stable gene followed by U6-1 (1.38 \pm 0.39) and Histone (1.65 \pm 0.39), whereas miR403, miR171 and miR482 were the most unstable genes with highest SV \pm SD and a SD value greater than

The rankings using the Delta Ct method are presented in Table 4. *EIF4A*, *U6-2* and *U6-1* were the top three stable genes at the callus and seedling stages. *PP2A-2* was the most stable gene at the plant stage and in all samples during these three developmental stages, followed by *U6-1*. This finding indicates that *EIF4A*, *PP2A-2* and *U6-1* might be the most stably expressed genes as determined using the Delta Ct method.

To obtain a consensus regarding the most stable reference genes as recommended by the four methods, the geometric mean of four algorithms corresponding rankings for each candidate gene were calculated using the RankAggreg software. EIF4A, U6-2 and U6-1 were ranked as the top three stable reference genes in samples from the callus developmental stage. U6-1 was the most stable gene at the seedling and plant stages, and U6-2 and PP2A-2 ranked second at the seedling stage and plant stage respectively. The expression values of miR403, miR171 and miR482 were extremely variable in all tissues at different stages. Based on these results, U6-1, EIF4A and PP2A-2 are the best combination of reference genes in all samples of different developmental stages. EIF4A and U6-2 are the most stable reference genes for the samples from callus stage. U6-1 and U6-2 are the best reference genes for the seedling stage, and U6-1 and PP2A-2 suitable for the plant stage.

Tang et al. Plant Methods (2019) 15:35 Page 5 of 15

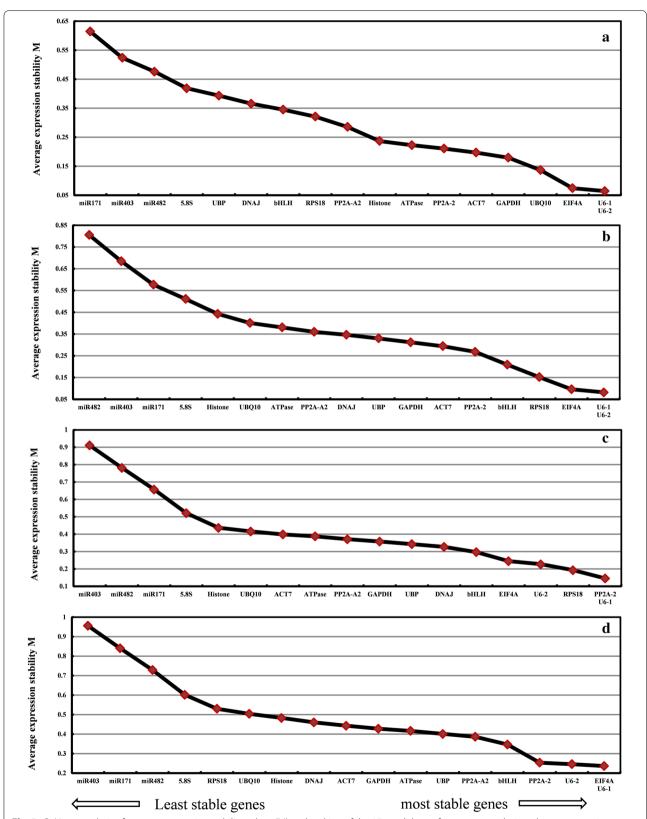


Fig. 2 GeNorm analysis of average expression stability values (M) and ranking of the 18 candidate reference genes during plant regeneration. **a** Callus stage, **b** seedling stage, **c** plant stage, **d** ALL samples. A lower value of average expression stability indicates more stable expression

Tang et al. Plant Methods (2019) 15:35 Page 6 of 15

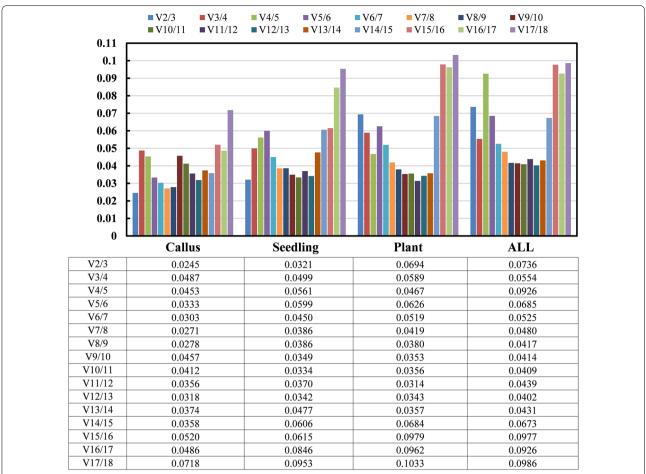


Fig. 3 The optimal number of reference genes for accurate normalization calculated by geNorm during plant regeneration. Pairwise variation (V_n/V_{n+1}) analysis of 18 candidate reference genes analyzed in four sample subsets. callus, callus and shoots induced by 84K leaves; seedling, various tissues from 84K seedling stage; plant, various tissues from 84K plant stage; ALL, all samples from callus, seedling and plant developmental stages

Expression stability of the candidate reference genes in AR developmental stage

The expression profiles of the 18 candidate reference genes and the ranking of their expression stability in the AR developmental stage were different from those during the plant regeneration processes. With the exception of 5.8 s and miRNAs, the Ct values for the remaining 14 candidate reference genes in the AR developmental stage were relatively higher compared with the other stages having most values between 27 and 33. The Ct values of miR482 (24.62 \pm 0.42) had a minimum SD value and 5.8s (22.93 \pm 4.70) had a maximum SD value (Additional file 3: Table S1). In geNorm analysis, EIF4A and PP2A-2 exhibited the highest stability with the lowest M-value. The pairwise variation was 0.133 for V2/3 values. Thus, the combined use of the two most stable reference genes would be suitable for normalizing gene expression analysis. Using NormFinder software, bHLH was identified as the most stable gene with the lowest stability value followed by *UBP* and *PP2A-2. miR482* (1.34 ± 0.33), *PP2A-A2* (1.41 ± 0.45) and *UBP* (1.42 ± 0.47) exhibited more stability with lower CV \pm SD calculated by Best-Keeper. *PP2A-2*, *ACT7* and *UBP* were the top three stable genes calculated using the Delta Ct method. RankAggreg ranked *PP2A-2*, *UBP* and *bHLH* as the top three stable reference genes in the AR developmental stages. In contrast, *5.8s*, miR171, miR403 and *GAPDH* were unstable genes identified by all algorithms (Table 5).

Reference genes validation

To validate the stability of the above reference genes, the expression profiles of miR166a, which is highly expressed in leaves and xylem [33], and *PtHB4*, which expressed specifically in shoot apex, cambium and xylem [34, 35], were measured and normalized with the most stable and the least stable reference genes. The three top ranking reference genes (*U6-1*, *EIF4A*,

Tang et al. Plant Methods (2019) 15:35 Page 7 of 15

Table 2 Ranking of the expression stability of candidate reference genes calculated using NormFinder during plant regeneration

Rank	Callus	Callus			Plants		Total		
	Gene	Stability	Gene	Stability	Gene	Stability	Gene	Stability	
1	Histone	0.041	U6-1	0.041	UBP	0.210	bHLH	0.275	
2	EIF4A	0.168	U6-2	0.041	bHLH	0.228	PP2A-2	0.302	
3	U6-2	0.213	EIF4A	0.043	DNAJ	0.247	U6-1	0.303	
4	U6-1	0.221	RPS18	0.082	U6-1	0.288	UBP	0.308	
5	PP2A-2	0.222	bHLH	0.151	PP2A-2	0.296	U6-2	0.376	
6	ACT7	0.277	GAPDH	0.267	RPS18	0.380	EIF4A	0.402	
7	ATPase	0.284	ACT7	0.282	PP2A-A2	0.418	GAPDH	0.419	
8	UBQ10	0.310	PP2A-2	0.288	UBQ10	0.424	PP2A-A2	0.427	
9	GAPDH	0.335	DNAJ	0.374	EIF4A	0.427	DNAJ	0.461	
10	RPS18	0.417	UBP	0.392	Histone	0.440	Histone	0.485	
11	5.8\$	0.424	PP2A-A2	0.472	ACT7	0.468	ATPase	0.499	
12	bHLH	0.428	Histone	0.508	U6-2	0.471	ACT7	0.521	
13	PP2A-A2	0.441	UBQ10	0.558	GAPDH	0.471	RPS18	0.561	
14	UBP	0.526	ATPase	0.575	ATPase	0.544	UBQ10	0.582	
15	DNAJ	0.533	<i>5</i> .8S	0.855	<i>5</i> .8S	0.921	<i>5.8</i> S	0.967	
16	miR482	0.712	miR171	0.901	miR171	1.405	miR171	1.473	
17	miR403	0.773	miR403	1.498	miR482	1.618	miR482	1.506	
18	miR171	1.288	miR482	1.710	miR403	1.852	miR403	1.767	

Table 3 Ranking of the expression stability of candidate reference genes calculated by BestKeeper during plant regeneration

Rank	Callus	Callus			Seedlings			Plants			Total		
	Gene	SD	CV	Gene	SD	CV	Gene	SD	CV	Gene	SD	CV	
1	EIF4A	0.07	0.28	Histone	0.27	1.14	EIF4A	0.43	1.63	EIF4A	0.37	1.39	
2	U6-2	0.08	0.31	U6-1	0.28	1	U6-2	0.49	1.77	U6-1	0.39	1.38	
3	U6-1	0.12	0.41	EIF4A	0.28	1.09	U6-1	0.52	1.83	Histone	0.39	1.65	
4	UBQ10	0.15	0.65	U6-2	0.29	1.09	Histone	0.53	2.2	U6-2	0.44	1.6	
5	Histone	0.16	0.65	RPS18	0.37	1.22	PP2A-2	0.54	1.99	PP2A-2	0.49	1.79	
6	ACT7	0.17	0.65	bHLH	0.4	1.48	GAPDH	0.58	2.4	bHLH	0.61	2.21	
7	ATPase	0.17	0.63	miR171	0.44	1.91	RPS18	0.6	1.94	GAPDH	0.61	2.54	
8	GAPDH	0.19	0.79	GAPDH	0.45	1.89	bHLH	0.69	2.48	UBP	0.66	2.1	
9	PP2A-2	0.19	0.69	PP2A-2	0.49	1.82	PP2A-A2	0.71	2.53	PP2A-A2	0.66	2.38	
10	PP2A-A2	0.32	1.15	DNAJ	0.49	1.96	DNAJ	0.71	2.65	ACT7	0.7	2.64	
11	bHLH	0.33	1.22	ACT7	0.56	2.19	ATPase	0.75	2.74	UBQ10	0.7	3.1	
12	<i>5.</i> 8S	0.33	1.5	UBQ10	0.57	2.55	UBP	0.76	2.39	DNAJ	0.71	2.69	
13	RPS18	0.34	1.15	UBP	0.6	1.94	ACT7	0.81	3.08	ATPase	0.74	2.7	
14	DNAJ	0.42	1.62	PP2A-A2	0.6	2.21	UBQ10	0.84	3.74	RPS18	0.76	2.48	
15	UBP	0.44	1.4	ATPase	0.63	2.36	<i>5.8</i> S	1.09	5.03	<i>5.8</i> S	0.93	4.25	
16	miR482	0.48	2.39	<i>5.8</i> S	0.79	3.62	miR482	1.27	6.11	miR482	1.11	5.39	
17	miR403	0.64	2.75	miR403	0.83	3.36	miR171	1.82	7.68	miR171	1.48	6.39	
18	miR171	0.88	4.14	miR482	1.22	5.8	miR403	1.97	7.62	miR403	1.63	6.47	

PP2A-2) either alone or combination and two unstable reference genes (5.8 s and miR403), were used as reference genes for RT-qPCR analysis at callus, seedling and

plant stages. As shown in Fig. 4, the relative expression profiles of miR166a and *PtHB4* normalized with *U6-1*, *EIF4A*, *PP2A-2*, *U6-1*+*EIF4A* and *U6-1*+*PP2A-2*

Tang et al. Plant Methods (2019) 15:35 Page 8 of 15

Table 4 Expression stability ranking of the 18 candidate reference genes during plant regeneration

1	2	3	4	5	6	7	8	9
across tissues at	callus stage (bet	ter–good–ave	rage)					
U6-1 U6-2		EIF4A	UBQ10	GAPDH	ACT7	PP2A-2	ATPase	Histone
Histone	EIF4A	U6-2	U6-1	PP2A-2	ACT7	ATPase	UBQ10	GAPDH
EIF4A	U6-2	U6-1	UBQ10	Histone	ACT7	ATPase	GAPDH	PP2A-2
EIF4A	U6-2	U6-1	Histone	PP2A-2	ATPase	ACT7	UBQ10	GAPDH
EIF4A	U6-2	U6-1	Histone	UBQ10	ACT7	PP2A-2	ATPase	GAPDH
across tissues at	seedlings stage	better-good-	-average)					
U6-1 U6-2	3 3	EIF4A	RPS18	bHLH	PP2A-2	ACT7	GAPDH	UBP
U6-1	U6-2	EIF4A	RPS18	bHLH	GAPDH	ACT7	PP2A-2	DNAJ
Histone	U6-1	EIF4A	U6-2	RPS18	bHLH	miR171	GAPDH	PP2A-2
	U6-1	EIF4A				ACT7		UBP
								DNAJ
	piaires stage (Se	-	_	FIF4A	bHI H	DNA I	URP	GAPDH
	hHI H							EIF4A
								PP2A-A2
								GAPDH
								PP2A-A2
			111 310	LII T/ (00 2	ODI	DIVIO	112/1/12
	is (better-good-	_	DD2A 2	ЬШШ	DD24 42	LIPD	ATPasa	GAPDH
·	0024.2							DNAJ
								PP2A-A2
								ATPase
								Histone
10	11	12	13	14	15	16	17	18
across tissues at	callus stage (bet	ter-good-ave	rage)					
PP2A-A2	RPS18	bHLH	DNAJ	UBP	<i>5.8</i> S	miR482	miR403	miR171
RPS18	<i>5.8</i> S	bHLH	PP2A-A2	UBP	DNAJ	miR482	miR403	miR171
PP2A-A2	bHLH	<i>5.8</i> S	RPS18	DNAJ	UBP	miR482	miR403	miR171
PP2A-A2	RPS18	bHLH	<i>5.8</i> S	DNAJ	UBP	miR482	miR403	miR171
RPS18	PP2A-A2	bHLH	<i>5.8</i> S	DNAJ	UBP	miR482	miR403	miR171
across tissues at	seedlings stage	(better-good-	-average)					
DNAJ	PP2A-A2	ATPase	UBQ10	Histone	<i>5</i> .8S	miR171	miR403	miR482
UBP	PP2A-A2	Histone	UBQ10	ATPase	<i>5.8</i> S	miR171	miR403	miR482
DNAJ	ACT7	UBQ10	UBP	PP2A-A2	ATPase	<i>5.8</i> S	miR403	miR482
DNAJ	PP2A-A2	ATPase	UBQ10	Histone		miR171	miR403	miR482
UBP	PP2A-A2	Histone	UBQ10	ATPase		miR171	miR403	miR482
across tissues at								
		9	9 .	Histone	5.85	miR171	miR482	miR403
								miR403
								miR403
U6-2	ACT7	UBQ10	ATPase	Histone	5.8S	miR171	miR482	miR403
002			ATPase	UBQ10	5.8S	miR171	miR482	miR403
GAPDH	Histone			ODQIO	5.05	11111117 1	111111702	HIIII
GAPDH	Histone	ACT7	7111 USC					
under all sample	es (better-good-	-average)		DDC 10	5 OC	miD402	miD171	miD402
under all sample	es (better–good- <i>DNAJ</i>	-average) Histone	UBQ10	RPS18	5.8S	miR482	miR171	miR403
under all sample ACT7 Histone	es (better–good- DNAJ ATPase	-average) Histone ACT7	UBQ10 RPS18	UBQ10	5.8\$	miR171	miR482	miR403
under all sample	es (better–good- <i>DNAJ</i>	-average) Histone	UBQ10					
	across tissues at U6-1 U6-2 Histone EIF4A EIF4A across tissues at U6-1 U6-2 U6-1 Histone U6-2 U6-1 across tissues at PP2A-2 U6-1 UBP EIF4A PP2A-2 U6-1 under all sample EIF4A U6-1 bHLH EIF4A PP2A-2 U6-1 10 across tissues at PP2A-A2 RPS18 PP2A-A2 RPS18 across tissues at DNAJ UBP DNAJ DNAJ UBP	across tissues at callus stage (bet U6-1 U6-2 Histone EIF4A EIF4A U6-2 EIF4A U6-2 across tissues at seedlings stage (bet U6-1 U6-2 U6-1 U6-2 Histone U6-1 U6-2 Histone U6-1 U6-2 Histone U6-1 U6-2 across tissues at plants stage (bet PP2A-2 U6-1 UBP BHLH EIF4A U6-2 PP2A-2 U6-1 U6-1 PP2A-2 EIF4A U6-1 BHLH PP2A-2 EIF4A U6-1 PP2A-2 U6-1 U6-1 EIF4A 10 11 across tissues at callus stage (bet PP2A-A2 RPS18 RPS18 RPS18 S.8S PP2A-A2 BHLH PP2A-A2 BPS18 RPS18 RPS2A-A2 ACT7 DNAJ PP2A-A2 UBP PP2A-A2 ACT7 DNAJ PP2A-A2 UBP RP2A-A2 ACT7 DNAJ PP2A-A2 ACT7 DNAJ PP2A-A2 ACT7 DNAJ PP2A-A2 ACT7 DNAJ ACT7 DNAJ PP2A-A2 ACT7 DNAJ ACT7	across tissues at callus stage (better–good–ave U6-1 U6-2	across tissues at callus stage (better-good-average) U6-1 U6-2	across tissues at callus stage (better-good-average) U6-1 U6-2	across tissues at callus stage (better-good-average) U6-1 U6-2 Histone	across tissues at callus stage (better-good-average) U6-I U6-2	across tissues at callus stage (better-good-average) U6-1 U6-2 EIF4A

Tang et al. Plant Methods (2019) 15:35 Page 9 of 15

Table 5 Ranking of candidate reference genes in order of their expression stability in the AR developmental stage

Ranking	Genorm		Normfinde	r	BestKeepe	r		Delta CT	RankAggreg
	Gene	Stability	Gene	Stability	Gene	SD	cv		
1	EIF4A PP2A-2	0.400	bHLH	0.422	miR482	0.33	1.34	PP2A-2	PP2A-2
2			UBP	0.424	PP2A-A2	0.45	1.41	ACT7	UBP
3	RPS18	0.432	PP2A-2	0.501	UBP	0.47	1.42	UBP	bHLH
4	bHLH	0.612	U6-1	0.517	ATPase	0.48	1.61	bHLH	PP2A-A2
5	UBP	0.669	PP2A-A2	0.576	ACT7	0.56	1.85	U6-1	ACT7
6	U6-1	0.704	U6-2	0.671	bHLH	0.61	2.03	PP2A-A2	miR482
7	ATPase	0.749	miR482	0.792	U6-1	0.67	2.08	miR482	U6-1
8	PP2A-A2	0.781	ACT7	0.830	PP2A-2	0.69	2.13	ATPase	EIF4A
9	ACT7	0.804	EIF4A	0.931	RPS18	0.81	2.51	EIF4A	ATPase
10	miR482	0.843	ATPase	0.934	Histone	0.83	2.73	U6-2	RPS18
11	Histone	0.877	Histone	0.951	U6-2	0.88	2.77	Histone	U6-2
12	U6-2	0.904	RPS18	1.054	UBQ10	1.00	3.55	DNAJ	Histone
13	DNAJ	0.941	DNAJ	1.078	DNAJ	1.03	3.23	UBQ10	DNAJ
14	GAPDH	0.963	UBQ10	1.160	EIF4A	1.04	3.32	RPS18	UBQ10
15	UBQ10	1.008	GAPDH	1.338	GAPDH	1.15	3.85	GAPDH	GAPDH
16	miR171	1.062	miR403	1.508	miR403	1.22	4.54	miR403	miR403
17	miR403	1.136	miR171	1.979	miR171	1.34	6.68	miR171	miR171
18	<i>5.8</i> \$	1.589	<i>5.8</i> S	4.693	<i>5.8</i> S	3.69	16.07	5.8\$	5.8\$

exhibited perfect consistency in seventeen tissues. Compared with tender leaves from 0.5-month-old seedlings, miR166a was highly expressed in stems, mature leaves and all samples at the callus stage (Fig. 4), whereas *PtHB4* was specifically expressed in stems and samples at the callus stage (Fig. 4). However, the expression values of miR166a and *PtHB4* normalized with 5.8s were increased, and the values normalized to miR403 were reduced compared with than other reference genes (Fig. 4). For example, the relative expression value of miR166 in mature leaves at 3 months was approximately 1500 when normalized with *U6-1*. However, the expression value was 4500 when normalized with 5.8 s and 18 when normalized with miR403.

Because the combined use of two most stable reference genes would be suitable for normalizing gene expression analysis at the AR developmental stage, *PP2A-2*, *UBP*, *bHLH*, *PP2A-2+UBP* and *PP2A-2+bHLH* were selected as stable reference genes, and 5.8s and miR403 were selected as the two least stable reference genes for RT-qPCR analysis of the AR developmental stage. As shown in Fig. 5, the relative expression values of miR166 and *PtHB4* normalized with *PP2A-2* were higher than values normalized with *bHLH*, but similar expression patterns were noted. Therefore, the combination of *PP2A-2* and *bHLH* could neutralize the expression values normalized with *PP2A-2* and *bHLH*. miR166 was highly

expressed in AR-60H, in which the AR callus regenerated and expanded. *PtHB4* exhibited a higher expression value in AR-18H when AR induction had begun. The relative expression profiles of miR166 and *PtHB4* normalized with *5.8s* and miR403 were reduced compared with values normalized with other reference genes, and different expression patterns were noted (Fig. 5). Overall, the combination of, *PP2A-2* and *UBP* or *PP2A-2* and *bHLH* should be the best reference gene set for normalization of qRT-PCR at the AR developmental stage.

Discussion

Numerous studies have performed reference gene validation experiments for mRNA and miRNA qRT-PCR [36, 37]. For example, some house-keeping genes, such as *ACT 7*, *UBQ*, *GAPDH* and *TUB*, were widely used for gene expression analysis of mRNAs in diverse plants, and several noncoding RNAs, such as *U6 snRNA* and *5.8S rRNA*, were typically chosen for normalizing miRNA quantification data. As miRNA research continues to expand, the potential use of miRNAs as reference genes has attracted increasing attention, and some small RNAs were obtained from plant species, such as grapevine [7], wheat [38], peach [39], soybean [40], and tea [41] demonstrating that miRNAs are more stable than the currently used reference genes under specific conditions. However, there are no reports on universal reference genes for

Tang et al. Plant Methods (2019) 15:35 Page 10 of 15

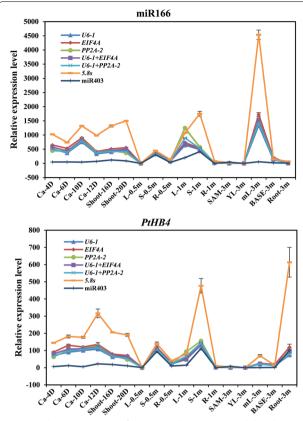
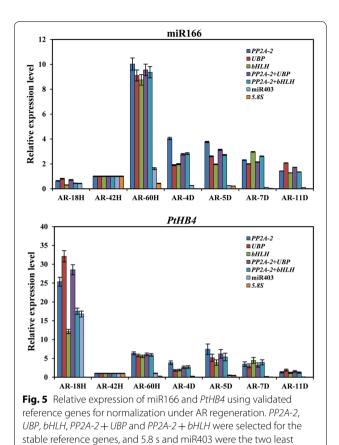


Fig. 4 Relative expression of miR166 and *PtHB4* using validated reference genes for normalization under plant regeneration process. The validated reference gene(s) used as normalization factors were one (*U6-1*, *EIF4A*, *PP2A-2* alone) or two (*U6-1* + *EIF4A* and *U6-1* + *PP2A-2*) of three best stable reference genes and two most unstable reference genes (*5.8s* and miR403)

the quantitative expression of both mRNA and miRNA, which may be necessary to calibrate both miRNA and its target gene(s) in a given sample. In general, the reverse transcription of miRNA is different from other types of RNA because of the shorter length of miRNA. Therefore, quantitative expression analysis of miRNAs and mRNAs requires different internal reference genes for normalization of their respective transcripts [15, 42]. If miRNA and mRNA expression data are normalized with universal internal reference genes, quantitative PCR must be performed at the same transcriptional level. Fortunately, Hurteau developed a modified universal reverse transcription PCR protocol that is designed to specifically amplify and quantify mRNAs and miRNAs from the same sample [17]. The modified technique involves the enzymatic addition of a poly A tail to non-poly(A) RNAs followed by reverse transcription using a universal RTprimer. Then, the transcript-specific forward primers can be used to amplify noncoding RNA (including miRNA) and mRNA from the same sample [17]. To obtain suitable



universal reference genes for normalization of miRNA and mRNA expression, the expression stability of the selected candidate reference genes in this study was validated across 38 tissue samples from four developmental stages in 84K poplar using a modified universal reverse transcription PCR protocol.

stable genes for normalization RT-qPCR analysis

Four algorithms (geNorm, NormFinder, DeltaCt, Bestkeeper) were used to minimize the bias for the evaluation of the 18 candidate reference genes. Discrepancy was observed in gene stability ranking and validation generated by the four different algorithms above. For example, at the plant stage, PP2A-2 was ranked first by geNorm and DeltaCt, whereas it was ranked fifth by NormFinder and Bestkeeper. Histone was ranked among the top four stable genes by BestKeeper in all samples at the seedling and plant stages but was ranked in the middle or bottom position by geNorm, NormFinder and DeltaCt. This apparent divergence is probably due to the statistical algorithms used to calculate stability. Genorm and Normfinder software have similar algorithms, which calculate the Δ Ct values and the stability of each internal reference gene according to the minimum Ct value in all the samples [43, 44]. Therefore, the alteration of the

Tang et al. Plant Methods (2019) 15:35 Page 11 of 15

minimum Ct value will have a great influence on the stability of expression of candidate reference genes. Besides that, BestKeeper program can calculate the standard deviation (SD) and variation coefficient (CV) values between the Ct values of each internal reference gene and the average of all Ct values, so the stability of candidate reference gene depending on the dispersion degree of Ct values [45]. Thus, it has been recommended that more than two algorithms should be used for reference gene stability evaluation [43]. In this study, RankAggreg software was used to generate the final overall ranking of the tested reference genes based on the geometric mean of the weights of every gene calculated by each program. Through this comprehensive ranking analysis, U6-1, EIF4A and PP2A-2 ranked as top three for all samples at the callus, seedling and plant stages. Thus, these genes would be the most suitable internal reference genes for the quantification of mRNAs and noncoding RNAs during the plant regeneration process of poplar.

However, the candidate reference genes selected for samples during the AR developmental stage were almost completely different. UBP ranked among the top three most stable genes in AR developmental stage but near the bottom at the callus stage using the four algorithms. In contrast, miR482 was the most stable gene in the AR developmental stage identified by Bestkeeper, but it was a highly unstable gene in other developmental stages. This is mainly because the development of adventitious roots is quite different from other biological processes, which include root primordium initiation, callus differentiation, adventitious root emergence and elongation process [46, 47]. During this process, tissue morphology and structure have undergone dramatic changes, and gene expression patterns varied tremendously [48–50]. Therefore, the genes expressed stably in other tissues or developmental stages may not have stable expression values during AR developmental stages. Comparatively, PP2A-2, UBP and bHLH exhibited more stable expression in the AR developmental stage; thus, these genes could be suitable for normalization. These results indicate that different sets of internal reference genes may be assigned for different tissues and developmental stages even in the same species. Furthermore, 5.8S, which is a commonly used reference gene for miRNA, and commonly used miR-NAs (miR171, miR482 and miR403) exhibited extremely unstable expression and were ranked among the four least stable genes during all developmental stages in poplar, indicating these miRNAs were more unstable than protein-coding genes and exhibited obvious tissue-specific expression.

Traditionally, reference genes are typically cellular maintenance genes that play housekeeping roles in basic cellular components and functions [23]. In this study,

with the exception of two house-keeping genes (EIF4A and PP2A-2), two noncoding RNA (U6-1 and U6-2) and a nontraditional reference gene (UBP) were also confirmed as the most suitable internal reference genes at the seedling and AR developmental stages. EIF4A and PP2A are typically used as reference genes for quantitative PCR and exhibit stable expression in different tissues, developmental stages or biotic and abiotic stress conditions in a number of species. For example, PP2A and EIF4A were reported as the best reference genes for all samples of various tissues and abiotic stress conditions in Sorghum [51], and PP2A was suitable for Switchgrass [52]. EIF4 α was also ranked as a stably expressed gene under most of the experimental conditions tested in Carica papaya [53], different tissue/organs and fruit developmental stages in Litsea cubeba [54], and different tissues under abiotic stresses in Pennisetum glaucum [55]. PP2A housekeeping genes were superior references for normalization of gene expression data in different cotton plant organs [56], different color lines of cineraria during flower developmental stages [57] and diurnal and developmental time-course in lettuce [58]. In addition, U6 is also one of the most commonly used reference genes in miRNA qRT-PCR and had the most stable expression in reference gene selection studies [7, 25, 41]. In our study, U6-1 and U6-2 exhibited the most stable expression values at the callus and seedling stages, and U6-1 ranked among the top two at the plant stage. Therefore, as a noncoding RNA, U6 can be used not only as a good reference gene for RT-qPCR of miRNA alone but also a universal internal reference gene for mRNA quantification. The UBP gene encodes a heterogeneous nuclear RNA binding protein (hnRNP) that is involved in the regulation of pre-mRNA maturation at different levels and pre-mRNA splicing [59]. UBP is not a traditional internal reference gene, but its expression value did not change in various tissues and developmental stages in poplar [60]. UBP was the most stably expressed gene in the AR regeneration stage, and the stability of *UBP* was ranked at the top and middle positions at the plant and seedling stages. This finding indicates that UBP might be a reliable reference gene used in the AR and plant developmental stages in poplar.

Conclusion

The purpose of this study was to identify the most appropriate reference genes for qRT-PCR of miRNAs and mRNAs during poplar regeneration and development. The expression stability of 18 candidate genes was validated and evaluated across 38 tissue samples from four developmental stages of 84K poplar using four algorithms. The results demonstrated that *EIF4A* and *U6-2* were suitable for samples of callus stage, *U6-1* and *U6-2*

Tang et al. Plant Methods (2019) 15:35 Page 12 of 15

were best for seedling stage samples. *PP2A-2* and *U6-1* were best for the plant stage, and *U6-1*, *EIF4A* and *PP2A-2* were the top three reference genes during the plant regeneration process in poplar. In addition, *PP2A-2* and *UBP* or *PP2A-2* and *bHLH* were the best combination as reference genes in the AR regeneration stage. This work will benefit future studies of expression and function analysis of miRNAs and their target genes in poplar.

Methods

Plant materials and tissue harvesting

The seedlings and plants of 84K poplar (Populus alba × Populus glandulosa) were grown in a tissue culture room under long-day conditions (16 h light/8 h dark) at 25/22 °C (day/night). Based on the Agrobacterium-mediated leaf disk transformation method [31, 32], the regeneration processes of poplar plants can be divided into three growth stages, including callus induction and shoots differentiation, seedlings on culture medium and plants in soil. Callus and shoot samples at different developmental stages were collected during shoot regeneration processes of 84K poplar [61], including callus induction stage at 4 days (Ca-4D), callus proliferation stage at 6 days (Ca-6D), callus expansion stage at 10 days (Ca-10D), callus transition stage at 12 days (Ca-12D), shoot emergence stage at 16 days (Shoot-16D) and the shoot elongation stage at 20 days (Shoot-20D). The samples from seedlings on the culture medium included the leaves (L-0.5M), stems (S-0.5M) and roots (R-0.5M) of 0.5-month-old seedlings as well as the leaves (L-1M), stems (S-1M) and roots (R-1M) of 1-month-old seedlings. The tissues from 3-month-old plants grown in soil included the shoot apical meristem (SAM-3M), unexpanded leaves (YL-3M), the first and second expanded leaves (ML-3M), the first to thirteenth internodes (N1-3M~N13-3M), the stem base (Base-3M), the roots (R-3M), and the root tips (RT-3M). The samples from the adventitious root (AR) developmental process included the AR induction stage at 18 h (AR-18H), the AR callus regeneration stage at 42 h and 60 h (AR-42H and AR-60H), the AR emergence stage at 4 and 5 days (AR-4D and AR-5D) and the AR elongation stage at 7 and 11 days (AR-7D and AR-11D) [61, 62]. Samples with three replicates were collected, immediately frozen and stored in liquid nitrogen.

Total RNA extraction and cDNA synthesis

Total RNA was extracted using the LC sciences Total RNA Purification Kit (#TRK-1001, LC sciences, USA), which purifies all sizes of total RNA, including mRNA, ribosomal RNA, miRNA and other small RNA (20–200 nt), according to the previous methods with some modification [63]. The powder ground from 50 mg sample in

liquid nitrogen was immediately transferred into a 2.0 ml RNase-free tube and added 600 µl extraction buffer with 6% Plant RNA Isolation Aid (Ambion, #Am9690). After shaking vigorously, the mixture was incubated in the ice for 15 min and then centrifuged at 12,000 rpm for 10 min at room temperate, by which the yield of total RNA could be improved. The remaining processes followed the manufacturer's instructions. The integrity of total RNA was further assessed by 1.5% agarose gel electrophoresis, and the RNA concentration and purity were determined by NanoDrop[™] 8000 Spectrophotometer (Thermo Fisher Scientific, USA). Only RNA samples with an A260/ A280 ratio between 1.9 and 2.1 and A260/A230 greater than 1.80 were used for cDNA synthesis. Then, 1.5 µg of total RNA was polyadenylated with ATP by poly (A) polymerase (PAP) at 37 °C for 1 h in a 20-µl reaction mixture using the Poly(A) Tailing Kit (#AM1350, Invitrogen, USA). Then, 10 µl (750 ng) of the E-PAP-treated total RNA was reverse transcribed with a poly(T) adapter universal reverse transcription (RT)-primer (5'-AACGAG ACGACGACAGACTTTTTTTTTTTTTTTV-3') using SuperScript III reverse transcriptase Kit (#18080-051, Invitrogen, USA) following the manufacturer's instruction. The cDNA was diluted 20-fold with nuclease-free water for qRT-PCR.

Selection of candidate reference genes and primers design

In this study, twenty candidate genes were selected to identify the most stable reference gene(s) for quantification of miRNAs and mRNAs by qRT-PCR analysis. Base on a literature list of commonly used reference genes from ICG (http://icg.big.ac.cn/index.php/Main_Page) in 115 plants excluding polar [64], eight frequently used candidate reference genes, including Actin 7 (ACT7), Eukaryotic initiation factor 4A III (EIF4A), Glyceraldehyde-3-phosphate dehydrogenase (GAPDH), Histone (Histone), Protein phosphatase 2A-2 (PP2A-2), Protein phosphatase 2A subunit A2 (PP2A-A2), Ribosomal protein S18 (RPS18) and Polyubiquitin 10 (UBQ10) were selected. In addition, four genes with more stable expression levels in various vegetative and reproductive tissues at different developmental stages of Populus tremula, including ATP synthase subunit B (ATPase), Oligouridylate binding protein 1B (UBP), bHLH transcription factor (bHLH) and DNAJ homologue 2 (DNAJ), were selected for candidate reference genes according to the mean values and standard deviations of gene expression values (Additional file 3: Table S2) [60, 65]. Furthermore, three small noncoding RNAs (U6-1, U6-2 and 5.8srRNA) were also selected from GenBank, and three miRNAs (miR171, miR403 and miR482.1) were selected from miRBase (V21.0). The sequences of these candidate genes were cloned from the cDNA of 84K poplar and confirmed Tang et al. Plant Methods (2019) 15:35 Page 13 of 15

through sequencing. The primers (Table 1) were designed using oligo 7.0 software (Molecular Biology Insights, USA) based on the following criteria: primer lengths of 20-28 bp, GC contents of 45–55%, melting temperature (TM) of 60–63 °C and amplicon length of 100-250 bp.

Quantitative real-time PCR analysis

Quantitative real-time PCR was conducted using LightCycler[®] 96 Plates and performed LightCycler® 480 System (Roche Molecular Systems, Germany). The reaction mixture contained 10 µl KAPA SYBR FAST qPCR Master Mix (# K4601, KAPA Biosystems, USA), 2 µl 20-fold diluted cDNA, 0.4 µM of each forward and reverse primer (Table 1) and ddH2O in a final volume of 20 µl. Amplifications were performed with the following program: 95 °C for 3 s; 40 cycles of 95 °C for 10 s, 60 °C for 30 s, 72 °C for 3 s; and melting curve analysis conditions (95 °C for 5 s, 65 °C increased to 95 °C with temperature increment of 0.11 °C every 1 s). No-template reactions were used as negative controls, and each sample was assessed in four technical replicates. Using a series of 10-fold diluted cDNA as templates, the standard curves were generated for each candidate reference gene. The correlation coefficient (R²) and slope were obtained from the linear regression model created by the LightCycle 480 system, and the PCR amplification efficiency (E) was calculated using the formulas $E = 10^{-1/slope} - 1$.

Stability analysis for the candidate reference genes

To visualize the expression stability of the 18 candidate reference genes, the raw cycle threshold (Ct) values from different tissues and developmental stages were produced and calculated statistically by box plots and five different programs and algorithms, including geNorm [43], NormFinder [44], BestKeeper [45], the Delta CT method [66, 67] and the RankAggreg software [68]. The geNorm algorithm can calculate the average expression stability value (M), which is defined as the average pairwise variation in a particular gene with all other potential reference genes. The threshold of M value was set as 1.5, and genes with lowest M values exhibit the most stable expression. Additionally, geNorm also calculates the pairwise variation $(V_n + V_{n+1})$ value that determines the optimal number of reference genes for accurate normalization with a cut-off value of $V_{n+1} < 0.15$ [43]. The NormFinder program uses an ANOVA-based model to consider intra- and intergroup variation in expression levels to calculate a stability value (SV) for expression, and a lower SV indicates increased stability [44]. Bestkeeper is an excel-based tool that determines the stability ranking of reference genes based on the coefficient of variance (CV) and the standard deviation (SD) of the average Ct values. The most

stable gene exhibits the lowest $CV \pm SD$ value, and genes with SD higher than 1 were considered unacceptable and were excluded [45]. The Delta Ct method compares the relative expression of 'pairs of genes' within each sample. The stability of the reference gene is ranked according to a 'process of elimination' technique, by which genes can be compared against one another and either selected or eliminated on the basis of Δ Ct among samples [66]. Finally, the raw Ct values of each gene were used to calculate the comprehensive ranking of reference genes using the RankAggreg software [68], which was based on the ranking of candidate references obtained from the four programs mentioned above. The program assigns an appropriate weight to an individual gene and calculates the geometric mean of the weight, providing an overall comprehensive ranking.

Validation of identified reference genes

To examine the expression stability of potential reference genes, the relative expression levels of miR166 and its target gene PtHB4 were analyzed in various tissues and AR developmental stages in poplar. The relative expression levels were normalized separately to the most stable and least stable reference genes analyzed by the four algorithms. The qRT-PCR amplification conditions of miRNA and genes were the same as described above. The relative expression levels of these genes were calculated according to the $2^{-\Delta\Delta Ct}$ method and presented as fold-change [69].

Additional files

Additional file 1: Fig. S1. The melting curves of candidate reference genes. **Fig. S2.** The PCR amplification specificities of candidate reference genes detected by agarose gel electrophoresis.

Additional file 2: Fig. S3. The sequence similarity of candidate reference genes compared between 84K poplar and *Populus trichocarpa*.

Additional file 3: Table S1. The average of Ct values in different tissues during plant and AR regeneration of Poplar. **Table S2.** The normalized expression values of 14 candidate reference genes in various vegetative and reproductive tissues at different developmental stages of *Populus tremula*

Authors' contributions

FT and ML designed the study. LC and FT designed the primers used for qPCR and cloned the sequences. WS and LW collected the tissues of plants and AR regeneration stages. FT, LC and XJ performed qPCR analysis. FT and ML wrote the manuscript. All of the authors carefully checked. All authors read and approved the final manuscript.

Author details

¹ State Key Laboratory of Tree Genetics and Breeding, Key Laboratory of Tree Breeding and Cultivation of the National Forestry and Grassland Administration, Research Institute of Forestry, Chinese Academy of Forestry, Beijing 100091, China. ² Co-Innovation Center for Sustainable Forestry in Southern China, Nanjing Forestry University, Nanjing 210037, China. ³ Key Laboratory of Horticultural Plant Biology of Ministry of Education, College

Tang et al. Plant Methods (2019) 15:35 Page 14 of 15

of Horticulture and Forestry Sciences, Huazhong Agricultural University, Wuhan 430070, China.

Acknowledgements

We thank Yanqiu Zhao and Jinnan Wang of State Key Laboratory of Tree Genetics and Breeding, Research Institute of Forestry, Chinese Academy of Forestry for their valuable plant material and technical contribution.

Competing interests

The authors declare that they have no competing interests.

Availability of data and materials

The datasets supporting the conclusions of this article are included within the article and its additional files.

Funding

This work was supported by the National Natural Science Foundation of China (31700592), and the Fundamental Research Funds for the Central Non-profit Research Institution of CAF (CAFYBB2017 QA003).

Publisher's Note

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

Received: 17 November 2018 Accepted: 1 April 2019 Published online: 06 April 2019

References

- Vanguilder HD, Vrana KE, Freeman WM. Twenty-five years of quantitative PCR for gene expression analysis. Biotechniques. 2008;44(5):619–26.
- Derveaux S, Vandesompele J, Hellemans J. How to do successful gene expression analysis using real-time PCR. Methods. 2010;50(4):227–30.
- Huggett J, Dheda K, Bustin S, Zumla A. Real-time RT-PCR normalisation; strategies and considerations. Genes Immun. 2005;6(4):279–84.
- 4. Nolan T, Hands RE, Bustin SA. Quantification of mRNA using real-time RT-PCR. Nat Protoc. 2006;1:1559.
- Brunner AM, Yakovlev IA, Strauss SH. Validating internal controls for quantitative plant gene expression studies. BMC Plant Biol. 2004;4:14.
- Wang C, Cui H-M, Huang T-H, Liu T-K, Hou X-L, Li Y. Identification and validation of reference genes for RT-qPCR analysis in non-heading Chinese cabbage flowers. Front Plant Sci. 2016;7:811.
- Luo M, Gao Z, Li H, Li Q, Zhang C, Xu W, Song S, Ma C, Wang S. Selection of reference genes for miRNA qRT-PCR under abiotic stress in grapevine. Sci Rep. 2018;8(1):4444.
- 8. Jones-Rhoades MW, Bartel DP, Bartel B. microRNAs and their regulatory roles in plants. Annu Rev Plant Biol. 2006;57:19–53.
- Voinnet O. Origin, biogenesis, and activity of plant microRNAs. Cell. 2009;136(4):669–87.
- Djuranovic S, Nahvi A, Green R. miRNA-mediated gene silencing by translational repression followed by mRNA deadenylation and decay. Science. 2012;336(6078):237–40.
- Laufs P, Peaucelle A, Morin H, Traas J. MicroRNA regulation of the CUC genes is required for boundary size control in Arabidopsis meristems. Development. 2004;131(17):4311–22.
- Aukerman MJ, Sakai H. Regulation of flowering time and floral organ identity by a microRNA and its APETALA2-like target genes. Plant Cell. 2003;15(11):2730–41.
- 13. Li B, Qin Y, Duan H, Yin W, Xia X. Genome-wide characterization of new and drought stress responsive microRNAs in *Populus euphratica*. J Exp Bot. 2011;62(11):3765–79.
- Lu S, Li Q, Wei H, Chang M-J, Tunlaya-Anukit S, Kim H, Liu J, Song J, Sun Y-H, Yuan L, et al. Ptr-miR397a is a negative regulator of laccase genes affecting lignin content in *Populus trichocarpa*. Proc Natl Acad Sci. 2013;110(26):10848–53.
- Guo C, Xu Y, Shi M, Lai Y, Wu X, Wang H, Zhu Z, Poethig RS, Wu G. Repression of miR156 by miR159 regulates the timing of the juvenileto-adult transition in Arabidopsis. Plant Cell. 2017;29(6):1293–304.

- Chen C, Ridzon DA, Broomer AJ, Zhou Z, Lee DH, Nguyen JT, Barbisin M, Xu NL, Mahuvakar VR, Andersen MR, et al. Real-time quantification of microRNAs by stem-loop RT-PCR. Nucleic Acids Res. 2005;33(20):e179.
- Hurteau GJ, Spivack SD, Brock GJ. Real-time quantification of miRNAs and mRNAs employing universal reverse transcription. In: MicroRNAs: from basic science to disease biology. 2008. p. 283–92.
- 18. Shi R, Chiang VL. Facile means for quantifying microRNA expression by real-time PCR. Biotechniques. 2005;39(4):519–25.
- Hurteau GJ, Spivack SD, Brock GJ. Report potential mRNA degradation targets of hsa-miR-200c, identified using informatics and qRT-PCR. Cell Cycle. 2006;5(17):1951–6.
- Chen C, Tan R, Wong L, Fekete R, Halsey J. Quantitation of microR-NAs by real-time RT-qPCR. In: Park DJ, editor. PCR protocols. Totowa: Humana Press; 2011. p. 113–34.
- Jain M, Nijhawan A, Tyagi AK, Khurana JP. Validation of housekeeping genes as internal control for studying gene expression in rice by quantitative real-time PCR. Biochem Biophys Res Commun. 2006;345(2):646–51.
- 22. Pettengill EA, Parmentier-Line C, Coleman GD. Evaluation of qPCR reference genes in two genotypes of Populus for use in photoperiod and low-temperature studies. BMC Res Notes. 2012;5(1):366.
- 23. Ma R, Xu S, Zhao Y, Xia B, Wang R. Selection and validation of appropriate reference genes for quantitative real-time PCR analysis of gene expression in *Lycoris aurea*. Front Plant Sci. 2016;7:536.
- Yu LL, Zhong XL. Evaluation of suitable reference genes for normalization of microRNA expression by real-time reverse transcription PCR analysis during longan somatic embryogenesis. Plant Physiol Biochem. 2013;66(66C):20–5.
- Yang Y, Zhang X, Chen Y, Guo J, Ling H, Gao S, Su Y, Que Y, Xu L. Selection of reference genes for normalization of microRNA expression by RT-qPCR in sugarcane buds under cold stress. Front Plant Sci. 2016;7:86.
- 26. Jansson S, Douglas CJ. Populus: a model system for plant biology. Annu Rev Plant Biol. 2007;58(1):435–58.
- Tuskan GA, DiFazio S, Jansson S, Bohlmann J, Grigoriev I, Hellsten U, Putnam N, Ralph S, Rombauts S, Salamov A, et al. The genome of black cottonwood, *Populus trichocarpa* (Torr. & Gray). Science. 2006;313:1596–604.
- 28. Fladung M, Kumar S, Ahuja MR. Genetic transformation of Populus genotypes with different chimaeric gene constructs: transformation efficiency and molecular analysis. Transgenic Res. 1997;6(2):111–21.
- 29. Busov VB, Brunner AM, Richard M, Sergei F, Lisa G, Sonali G, Strauss SH. Genetic transformation: a powerful tool for dissection of adaptive traits in trees. New Phytol. 2010;167(1):9–18.
- Wang G, Castiglione S, Chen Y, Li L, Han Y, Tian Y, Gabriel DW, Han Y, Mang K, Sala F. Poplar (*Populus nigra* L.) plants transformed with a *Bacillus thur-ingiensis* toxin gene: insecticidal activity and genomic analysis. Transgenic Res. 1996;5(5):289–301.
- 31. De Block M. Factors influencing the tissue culture and the *Agrobacterium tumefaciens*-mediated transformation of hybrid aspen and poplar clones. Plant Physiol. 1990;93(3):1110–6.
- 32. Han KH, Meilan R, Ma C, Strauss SH. An *Agrobacterium tumefaciens* transformation protocol effective on a variety of cottonwood hybrids (genus Populus). Plant Cell Rep. 2000;19(3):315–20.
- Puzey JR, Karger A, Axtell M, Kramer EM. Deep annotation of Populus trichocarpa microRNAs from diverse tissue sets. PLoS ONE. 2012;7(3):e33034.
- Zhu Y, Song D, Sun J, Wang X, Li L. PtrHB7, a class III HD-Zip gene, plays a critical role in regulation of vascular cambium differentiation in Populus. Mol Plant. 2013;6:1331–43.
- Côté CL, Boileau F, Roy V, Ouellet M, Levasseur C, Morency M-J, Cooke JE, Séguin A, MacKay JJ. Gene family structure, expression and functional analysis of HD-Zip III genes in angiosperm and gymnosperm forest trees. BMC Plant Biol. 2010;10(1):273.
- Brunner AM, Yakovlev IA, Strauss SH. Validating internal controls for quantitative plant gene expression studies. BMC Plant Biol. 2004;4(1):14. https://doi.org/10.1186/1471-2229-1184-1114.
- Wang H, Chen J, Tian Q, Wang S, Xia X, Yin W. Identification and validation of reference genes for *Populus euphratica* gene expression analysis during abiotic stresses by quantitative real-time PCR. Physiol Plant. 2014;152(3):529–45.

Tang et al. Plant Methods (2019) 15:35 Page 15 of 15

- Feng H, Huang X, Zhang Q, Wei G, Wang X, Kang Z. Selection of suitable inner reference genes for relative quantification expression of microRNA in wheat. Plant Physiol Biochem. 2012;51(51):116–22.
- Luo X, Shi T, Sun H, Song J, Ni Z, Gao Z. Selection of suitable inner reference genes for normalisation of microRNA expression response to abiotic stresses by RT-qPCR in leaves, flowers and young stems of peach. Sci Hortic. 2014;165(3):281–7.
- Kulcheski FR, Marcelino-Guimaraes FC, Nepomuceno AL, Abdelnoor RV, Margis R. The use of microRNAs as reference genes for quantitative polymerase chain reaction in sovbean. Anal Biochem. 2010;406(2):185–92.
- Song H, Zhang X, Shi C, Wang S, Wu A, Wei C. Selection and verification of candidate reference genes for mature microRNA expression by quantitative RT-PCR in the tea plant (*Camellia sinensis*). Genes. 2016;7(6):25.
- Xu J, Li J, Cui L, Zhang T, Wu Z, Zhu P-Y, Meng Y-J, Zhang K-J, Yu X-Q, Lou Q-F, et al. New insights into the roles of cucumber TIR1 homologs and miR393 in regulating fruit/seed set development and leaf morphogenesis. BMC Plant Biol. 2017:17(1):130.
- Vandesompele J, De Preter K, Pattyn F, Poppe B, Van Roy N, De Paepe A, Speleman F. Accurate normalization of real-time quantitative RT-PCR data by geometric averaging of multiple internal control genes. Genome Biol. 2002;3(7):RFSFARCH0034.
- 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 Res. 2004;64(15):5245–50.
- Pfaffl MW, Tichopad A, Prgomet C, Neuvians TP. Determination of stable housekeeping genes, differentially regulated target genes and sample integrity: BestKeeper–Excel-based tool using pair-wise correlations. Biotech Lett. 2004;26(6):509–15.
- Leguã© V, Rigal A, Bhalerao RP. Adventitious root formation in tree species: involvement of transcription factors. Physiol Plant. 2014:151(2):192–8.
- Bellini C, Pacurar DI, Perrone I. Adventitious roots and lateral roots: similarities and differences. Annu Rev Plant Biol. 2014;65(65):639–66.
- Monika B, Leonel VZ, Wenbin L, Deborah C, Sederoff RR, Clapham DH, Sara VA. Microarray analyses of gene expression during adventitious root development in Pinus contorta. Plant Physiol. 2004;135(3):1526–39.
- Villacorta-Martín C, Sánchez-García AB, Villanova J, Cano A, Rhee MVD, Haan JD, Acosta M, Passarinho P, Pérez-Pérez JM. Gene expression profiling during adventitious root formation in carnation stem cuttings. BMC Genomics. 2015;16(1):1–18.
- Li YH, Zhang HN, Wu QS, Muday GK. Transcriptional sequencing and analysis of major genes involved in the adventitious root formation of mango cotyledon segments. Planta. 2017;245(6):1193–213.
- Sudhakar Reddy P, Srinivas Reddy D, Sivasakthi K, Bhatnagar-Mathur P, Vadez V, Sharma KK. Evaluation of sorghum [Sorghum bicolor (L.)] reference genes in various tissues and under abiotic stress conditions for quantitative real-time PCR data normalization. Front Plant Sci. 2016;7:529.
- Gimeno J, Eattock N, Van Deynze A, Blumwald E. Selection and validation of reference genes for gene expression analysis in switchgrass (*Panicum virgatum*) using quantitative real-time RT-PCR. PLoS ONE. 2014;9(3):e91474.
- Zhu X, Li X, Chen W, Chen J, Lu W, Chen L, Fu D. Evaluation of new reference genes in papaya for accurate transcript normalization under different experimental conditions. PLoS ONE. 2012;7(8):e44405.

- Lin L, Han X, Chen Y, Wu Q, Wang Y. Identification of appropriate reference genes for normalizing transcript expression by quantitative real-time PCR in *Litsea cubeba*. Mol Genet Genomics. 2013;288(12):727–37.
- 55. Reddy PS, Reddy DS, Sharma KK, Bhatnagar-Mathur P, Vadez V. Cloning and validation of reference genes for normalization of gene expression studies in pearl millet [Pennisetum glaucum (L.) R. Br.] by quantitative real-time PCR. Plant Gene. 2015;1(1):35–42.
- Artico S, Nardeli SM, Brilhante O, Grossi-de-Sa MF, Alves-Ferreira M. Identification and evaluation of new reference genes in Gossypium hirsutum for accurate normalization of real-time quantitative RT-PCR data. BMC Plant Biol. 2010;10(1):49.
- 57. Jin X, Fu J, Dai S, Sun Y, Hong Y. Reference gene selection for qPCR analysis in cineraria developing flowers. Sci Hortic. 2013;153(153):64–70.
- 58. Sgamma T, Pape J, Massiah A, Jackson S. Selection of reference genes for diurnal and developmental time-course real-time PCR expression analyses in lettuce. Plant Methods. 2016;12(1):21.
- Lambermon MHL, Simpson GG, Kirk DAW, Hemmingsmieszczak M, Klahre U, Filipowicz W. UBP1, a novel hnRNP-like protein that functions at multiple steps of higher plant nuclear pre-mRNA maturation. EMBO J. 2014;19(7):1638–49.
- David S, Chanaka M, Sergiu N, Nicolas D, Yao-Cheng L, Andreas S, Van De Yves P, Stefan J, Hvidsten TR, Street NR. The plant genome integrative explorer resource: PlantGenlE.org. New Phytol. 2015;208(4):1149–56.
- Liu B, Zhang J, Wang L, Li J, Zheng H, Chen J, Lu M. A survey of Populus PIN-FORMED family genes reveals their diversified expression patterns. J Exp Bot. 2014;65(9):2437–48.
- Shu W, Zhou H, Jiang C, Zhao S, Wang L, Li Q, Yang Z, Groover A, Lu M-Z. The auxin receptor TIR1 homolog (PagFBL1) regulates adventitious rooting through interactions with Aux/IAA28 in Populus. Plant Biotechnol J. 2018:17:338–49.
- Tang F, Wei H, Zhao S, Wang L, Zheng H, Lu M. Identification of microR-NAs involved in regeneration of the secondary vascular system in *Populus tomentosa* Carr. Front Plant Sci. 2016;7:724.
- Sang J, Wang Z, Li M, Cao J, Niu G, Xia L, Zou D, Wang F, Xu X, Han X, et al. ICG: a wiki-driven knowledgebase of internal control genes for RT-qPCR normalization. Nucleic Acids Res. 2018;46(D1):D121–6.
- Robinson KM, Delhomme N, Mähler N, Schiffthaler B, Önskog J, Albrectsen BR, Ingvarsson PK, Hvidsten TR, Jansson S, Street NR. *Populus tremula* (European aspen) shows no evidence of sexual dimorphism. BMC Plant Biol. 2014;14(1):276.
- Silver N, Best S, Jiang J, Thein SL. Selection of housekeeping genes for gene expression studies in human reticulocytes using real-time PCR. BMC Mol Biol. 2006;7(1):33.
- Schmittgen TD, Livak KJ. Analyzing real-time PCR data by the comparative CT method. Nat Protoc. 2008;3:1101.
- Pihur V, Datta S, Datta S. RankAggreg, an R package for weighted rank aggregation. BMC Bioinform. 2009;10(1):62.
- Livak KJ, Schmittgen TD. Analysis of relative gene expression data using real-time quantitative PCR and the 2^{-ΔΔCT} method. Methods. 2001;25(4):402–8.

Ready to submit your research? Choose BMC and benefit from:

- fast, convenient online submission
- $\bullet\,$ thorough peer review by experienced researchers in your field
- rapid publication on acceptance
- support for research data, including large and complex data types
- gold Open Access which fosters wider collaboration and increased citations
- maximum visibility for your research: over 100M website views per year

At BMC, research is always in progress.

Learn more biomedcentral.com/submissions

