



# Selection and Validation of Reference Genes for Accurate RT-qPCR Data Normalization in *Coffea* spp. under a Climate Changes Context of Interacting Elevated [CO<sub>2</sub>] and Temperature

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World coffee production has faced increasing challenges associated with ongoing climatic changes. Several studies, which have been almost exclusively based on temperature increase, have predicted extensive reductions (higher than half by 2,050) of actual coffee cropped areas. However, recent studies showed that elevated [CO<sub>2</sub>] can strongly mitigate the negative impacts of heat stress at the physiological and biochemical levels in coffee leaves. In addition, it has also been shown that coffee genotypes can successfully cope with temperatures above what has been traditionally accepted. Altogether, this information suggests that the real impact of climate changes on coffee growth and production could be significantly lower than previously estimated. Gene expression studies are an important tool to unravel crop acclimation ability, demanding the use of adequate reference genes. We have examined the transcript stability of 10 candidate reference genes to normalize RT-gPCR expression studies using a set of 24 cDNAs from leaves of three coffee genotypes (CL153, Icatu, and IPR108), grown under 380 or 700  $\mu$ L CO<sub>2</sub> L<sup>-1</sup>, and submitted to increasing temperatures from 25/20°C (day/night) to 42/34°C. Samples were analyzed according to genotype, [CO<sub>2</sub>], temperature, multiple stress interaction ([CO2], temperature) and total stress interaction (genotype, [CO<sub>2</sub>], and temperature). The transcript stability of each gene was assessed through a multiple analytical approach combining the Coeficient of Variation method and three algorithms (geNorm, BestKeeper, NormFinder). The transcript stability varied according to the type of stress for most genes, but the consensus ranking obtained with RefFinder, classified MDH as the gene with the highest mRNA stability to a global

1

use, followed by *ACT* and *S15*, whereas  $\alpha$ -*TUB* and *CYCL* showed the least stable mRNA contents. Using the coffee expression profiles of the gene encoding the large-subunit of ribulose-1,5-bisphosphate carboxylase/oxygenase (*RLS*), results from the *in silico* aggregation and experimental validation of the best number of reference genes showed that two reference genes are adequate to normalize RT-qPCR data. Altogether, this work highlights the importance of an adequate selection of reference genes for each single or combined experimental condition and constitutes the basis to accurately study molecular responses of *Coffea* spp. in a context of climate changes and global warming.

Keywords: climate changes, coffee, increased air [CO<sub>2</sub>], global warming, heat stress, normalization of transcriptomic studies, quantitative real-time PCR, reference genes

# INTRODUCTION

Impacts from recent climate-related extremes, such as heat and cold waves, droughts and strong rainfall events, reveal remarkable vulnerability of agricultural systems. Estimated future climate changes are expected to further amplify the existing climate-related risks and create new ones (IPCC, 2013). Within this context, it is important to assess crop ability to adapt their vital processes at a speed compatible with these environmental changes, allowing the selection and breeding of elite genotypes.

Coffee is one of the most important agricultural traded commodities, growing in more than 60 tropical countries. It is estimated that *ca*. 25 million farmers produce coffee in over 1 million ha, with a majority of smallholders whose livelihoods depend on this crop (Waller et al., 2007). In the last years, worldwide crop yields were above 8 million tons of green coffee beans (ICO, 2014a), generating an income of *ca*. US\$ 173,000 million (ICO, 2014b), and involving approximately 100 million people considering the entire chain of value of coffee (Bunn et al., 2015).

Coffee production and quality are highly dependent on a regular sequence of climate events; temperature and water availability are considered the most important limiting environmental variables to this crop (DaMatta and Ramalho, 2006). Also, several modeling studies on the global impact of climate changes, mostly focused on increased air temperatures, have predicted reductions of suitable areas for Arabica coffee (up to *ca.* 50%) by 2,050 (Bunn et al., 2015; Magrach and Ghazoul, 2015), compromising the livelihoods of millions of small householders.

Under field conditions, the superimposition of environmental events is the most common situation, as is expected to be the case of elevated [CO<sub>2</sub>] and enhanced temperatures predicted along this century. In fact, depending on anthropogenic greenhouse gas emission scenarios, [CO<sub>2</sub>] might reach between 421 and 936  $\mu$ L CO<sub>2</sub> L<sup>-1</sup> by 2,100, accompanied by a global warming up to between 2.6 and 4.8°C relative to 1986–2005 (IPCC, 2013, 2014). However, it was recently shown that increased [CO<sub>2</sub>] in the atmosphere strengthens the coffee plant by reinforcing its

photosynthetic performance (Ramalho et al., 2013; Ghini et al., 2015; DaMatta et al., 2016). Furthermore, enhanced  $[CO_2]$  has a crucial role in the mitigation of heat impact, and, therefore, in the resilience of coffee plant to supra-optimal temperatures, with positive repercussions ranging from mineral nutrition (Martins et al., 2014) to the triggering of defense mechanisms and altered gene expression (Martins et al., 2014; Rodrigues et al., 2016). Therefore, the catastrophic predictions on the future of the coffee crop, that are based almost exclusively on temperature drift (Rodrigues et al., 2016), should be reconsidered. In addition, results from Rodrigues et al. (2016) strongly suggest the need to study the single and superimposed effects of elevated  $[CO_2]$  and supra-optimal temperatures at all plant levels, from morphology up to the molecular assessment.

The release of Coffea sp. expressed sequence tag (EST) databases (e.g., Poncet et al., 2006; Vieira et al., 2006; Mondego et al., 2011) and Coffea canephora genome (http://coffeegenome.org/) has greatly prompted the study of genes involved in important agronomic and stress tolerance traits, making marker-assisted selection a straight forward approach. Gene expression analysis is an important tool to elucidate the complex regulatory networks of the genetic, signaling, and metabolic mechanisms that underlie plant-environmental interactions (Mallona et al., 2010). Monitoring differential gene expression and validating high-throughput RNA sequencing (RNA-seq) data is ideally achieved through quantitative real-time PCR (RTqPCR) analysis. However, accuracy and reliability of RT-qPCR relies on the normalization of gene expression data (Artico et al., 2010; Die et al., 2010). To avoid severe pitfalls in data analysis and interpretation, this implies the selection and systematic validation of suitable reference genes to be used as internal controls. In fact, expression stability should be validated for each particular plant tissue/organ, cell, and experimental conditions, particularly when involving environmental stressful conditions (Die et al., 2010; El Kelish et al., 2014; Imai et al., 2014; da Costa et al., 2015). In addition, the stability of reference gene transcripts is also species-dependent (Andersen et al., 2004; Gutierrez et al., 2008a,b), as in the case of coffee (Cruz et al., 2009; Goulao et al., 2012). A number of housekeeping genes (e.g., b-actin, elongation factor1a, 18S ribosomal RNA, and polyubiquitin) involved in general cell metabolism pathways are widely used to calibrate RT-qPCR studies in biological systems (Willems et al., 2008;

Abbreviations: RT-qPCR, quantitative real-time polymerase chain reaction.

Goulao et al., 2012; Imai et al., 2014; da Costa et al., 2015; Llanos et al., 2015). However, their expression levels may vary with the experimental conditions (Petriccione et al., 2015), and their use as internal reference genes should be taken with caution (Gutierrez et al., 2008a,b). For instance, *GAPDH* has been indicated as one of the most stable genes during single abiotic stresses (Tian et al., 2015), whereas it appeared to be the least stable gene during the plant development (Wang et al., 2016). In addition, the species-dependent stability of reference gene transcripts was observed, for example, in *TUB-A*, which is the most stable reference gene during celery development (Li et al., 2016) in contrast with what has been observed during the development of cherry (Ye et al., 2015).

In a context of advancing our knowledge regarding the plant responses to estimated climate changes and global warming, this work examined, for the first time, the transcript stability of candidate reference genes to accurately perform the normalization of RT-qPCR data from expression studies of *Coffea* spp. plants exposed to conditions mimicking predicted future environmental conditions. For that, single and combined impacts of elevated [CO<sub>2</sub>] and heat were considered.

# MATERIALS AND METHODS

# **Plant Material and Growth Conditions**

Plant materials and experimental design was previously described in detail (Rodrigues et al., 2016). Briefly, three widely cropped coffee genotypes from the two main producing species were used: Coffea arabica L. cv. Icatu (an introgressed variety from C. canephora Pierre ex A. Froehner), C. arabica L. cv. IPR108, and C. canephora cv. Conilon Clone 153 (CL153). Potted plants of 1.5 years in age were transferred from a greenhouse (ambient [CO<sub>2</sub>]) into walk-in growth chambers (EHHF 10,000, ARALAB, Portugal) differing in air [CO<sub>2</sub>] supply: 380  $\mu$ L CO<sub>2</sub> L<sup>-1</sup> (380-plants) or 700  $\mu$ L CO<sub>2</sub> L<sup>-1</sup> (700-plants). Both groups of plants were then grown for 10 months in 28 L pots for ca. 10 months under controlled environmental conditions of temperature (25/20°C, day/night), RH (75%), irradiance (ca. 700–800  $\mu$ mol m<sup>-2</sup> s<sup>-1</sup>), photoperiod (12 h), without limitations of nutrients (Ramalho et al., 2013), water and space for root growth, the latter evaluated by visual examination at the end of the experiment, after removing the plants from their pots.

After that 10 months period, air temperature was gradually increased at a rate of  $0.5^{\circ}$ C day<sup>-1</sup>, from 25/20°C up to 42/34°C, with a 7 day stabilization at 31/25, 37/30 and 42/34°C to perform several evaluations (Martins et al., 2014, 2016; Rodrigues et al., 2016). Leaf material was collected from newly matured leaves, of both plagiotropic and orthotropic branches of the upper (illuminated) part of the plant, from five to eight plants per genotype and immediately frozen in liquid nitrogen and stored at  $-80^{\circ}$ C until RNA extraction.

# **Total RNA Isolation and cDNA Synthesis**

Total RNA was isolated and quantified as described in Goulao et al. (2012) for each of the following 24 conditions: three genotypes (CL153, Icatu, IPR108), four temperature regimes (25/20°C, 31/25°C, 37/30°C, 42/34°C), and two [CO<sub>2</sub>] (380, 700  $\mu$ L CO<sub>2</sub> L<sup>-1</sup>), using the RNeasy Plant Mini Kit (Qiagen,

Germany) according to the manufacturer's protocol. In order to avoid eventual genomic DNA contaminations, RNA samples were digested with Ambion<sup>®</sup> DNA-*free*<sup>TM</sup> DNase (Ambion, USA). RNA integrity was verified in 1.5% agarose—TAE gel electrophoresis containing GelRed Nucleic Acid Gel Stain (Biotium, USA). All RNA samples were individually analyzed for the possible presence of DNA contamination by standard PCR reactions (35 cycles) using primers designed for ubiquitin (UBQ) gene (**Table 1**), in the absence of cDNA synthesis. Total RNA concentration and purity were further verified through BioDrop Cuvette (BioDrop, UK) measurements to guarantee the same amount of starting material in subsequent cDNA synthesis. RNA concentrations ranged between 333 and 1,056 ng/µl, with OD 260:280 ratios always above 1.98.

One microgram of DNA-free total RNA was used to synthesize first-strand cDNAs using oligo- $(dT)_{18}$  primer and the SuperScript II first-strand synthesis system (Invitrogen, USA).

# Selection of Reference Gene Sequences and Primer Design

A set of 10 candidate genes were selected, comprising several frequently used reference genes, based on previous reports in (a) coffee plants (Cruz et al., 2009; Goulao et al., 2012; Carvalho et al., 2013): actin (ACT), glyceraldehyde 3-phosphate dehydrogenase (GAPDH), eukaryotic initiation factor  $4\alpha$  (Elf4A), elongation factor 1a (EF1A), cyclophilin (CYCL), and malate dehydrogenase (MDH); and (b) other plants (Cseke et al., 2009; El Kelish et al., 2014; Watanabe et al., 2014; Yan et al., 2014): 40S ribosomal protein subunit 15A (S15), DNAJ-like (DNAJ), ubiquitin-conjugating enzyme E2(UBQ2), and a alpha tubulin ( $\alpha$ -TUB). The corresponding gene sequences were retrieved from published literature and the NCBI databases (Cruz et al., 2009; Vidal et al., 2010; Mondego et al., 2011; Goulao et al., 2012; Carvalho et al., 2013). Primers were designed using Primer3 software (Rozen and Skaletsky, 2000). The length of the primers was set to be between 19 and 26 bp, with a GC content ranging from 45 to 60% and a melting temperature (*Tm*-value) between 62° and 65°C. Amplicon length ranges were set to be between 100 and 150 bp. The probability of formation of hairpin structures and primer dimerization was subsequently checked using the Oligo Calculator (version. 3.26) algorithm (Kibbe, 2007). Primer sequences are given in Table 1.

# **Quantitative Real-Time Polymerase Chain Reaction Conditions**

RT-qPCR reactions were performed in 96-well plates using  $iQ^{TM}$  SYBR<sup>®</sup> Green Supermix (BioRad, USA). Reactions were prepared in volumes of 25 µl containing 150 ng of cDNA and 3 µM each primer, in  $1 \times iQ^{TM}$  SYBR<sup>®</sup> Green Supermix. Reactions were run on the  $iQ^{TM}$  5 Real-Time Detection System (BioRad, USA) using the following parameters: hot start activation of the TaqDNA polymerase at 95°C for 10 min, followed by 40 cycles of denaturation 95°C for 15 s; annealing at 60°C for 30 s; elongation at 72°C for 30 s; and plate read. To verify the specificity of each amplification, and the absence of primer dimers, dissociation curves were obtained for each amplicon at the end of the PCR run, by continuous fluorescence measurement from 55° to 95°C, with sequential steps of 0.5°C for 15 s. Three

| Gene symbol | Primer sequence (5'-3')                            | Gene name                                | Acession number | Amplicon size (bp) |
|-------------|--|--|-----------------|--------------------|
| UBQ2        | GATGATACTTGGCCCTGCAC<br>CCTTCCCAGCTTGTCAATGT       | Ubiquitin-conjugating enzyme E2          | GR984245        | 142                |
| a-Tub       | GTGCATCTCCATCCACATTG<br>GGTGTTGAAAGCGTCGTCT        | Alpha-tubulin                            | GT009437        | 146                |
| S15         | CAATAGGGGCTTGAAGAGG<br>TACGCTGCCAATCATCTCAG        | 40S ribosomal protein S15                | GR987196        | 146                |
| DNAJ        | GGTGAAGCTGATGAAGCAC<br>CCGGGCTGGGATTTAATAAG        | Plant DNA J protein                      | GR986679        | 157                |
| MDH         | CCTGATGTCAACCACGCAACT<br>GTGGTTATGAACTCTCCATTCAACC | Malate dehydrogenase                     | GW464198.1      | 100                |
| ACT         | AAGCTTGCCTATGTGGCTCTTG<br>TCACTTGTCCATCTGGCAATTC   | Actin                                    | GT000704        | 100                |
| ELF-4A      | GGTTATGCGTGCTCTGGGTGAC<br>ATGAACCCCACTGGAAAGAATG   | Eukaryotic initiation factor $4\alpha$   | GT71729         | 103                |
| CYCL        | AGCTCTACGCAGACACGACTCC<br>GGTCGATCCTTTGAAGTGCAAG   | Cyclophilin                              | GT007167        | 115                |
| EF1A        | CATTGTGGTCATTGGTCATGTC<br>ACACGCTTGTCAATTCCTCCA    | Elongation factor $1\alpha$              | GR996930        | 87                 |
| GAPDH       | AGGCTGTTGGGAAAGTTCTTC<br>ACTGTTGGAACTCGGAATGC      | Glyceraldehyde 3-phosphate dehydrogenase | DV692958        | 100                |

TABLE 1 | Primer sequences and amplicon characteristics for each of the 10 candidate reference genes under evaluation.

technical replicates were used for each biological replicate and the mean Ct was used for data analyses. The full sample set was always included in each technical replicate to exclude any artifacts consequential of between-run variations. No signals were detected in non-template controls run in parallel for each primer set. Two negative controls were included for each primer pair, in which cDNA was replaced by water or total RNA.

## **Calculation of PCR Efficiencies**

Five-fold serial dilutions (1:1–1:625) of pooled cDNAs, which included equal-molar quantities of all samples independently for each genotype, were quantified in triplicates to generate standard curves for each primer pair. Based on the slopes of the standard curves, the PCR efficiency of each gene, for each genotype, was determined from the respective logarithm of the cDNA dilution, plotted against the mean threshold cycle (*Ct*) values. The reaction efficiency was calculated using the equation:  $E(\%) = (10-(1/slope)-1) \times 100$  (da Costa et al., 2015), where E is the efficiency, in percentage, and slope is the gradient of the best-fit line in the linear regression.

## **Selection of Reference Genes**

The global transcript variability of each candidate reference gene was analyzed through statistical parameters using Box Plot. The variation of gene expression was calculated by means of coefficient of variation (CV), where CV = (standard deviation mean) × 100. These analyzes were performed using the statistical program R Core Team (2016). In order to select the best reference genes for the experimental conditions, expression stability was analyzed using geNorm (Vandesompele et al., 2002), NormFinder (Andersen et al., 2004) and BestKeeper (Pfaffl et al., 2004). The final rank of reference genes was determined with the RefFinder program (Xie et al., 2012), a webbased user-friendly comprehensive tool that integrates geNorm, Normfinder, BestKeeper, and the comparative Ct method.

# Determination of the Minimum Number of Reference Genes for Data Normalization

The pairwise variations (V-values) were calculated using the final ranking determined by RefFinder, through pairwise variation  $(V_n/V_{n+1})$  of two consecutively serial log<sub>2</sub>-transformed normalization factor (NF) ratios, based on stepwise addition of the subsequent more stable reference gene (NFn relative to  $NF_{n+1}$  reference genes; Vandesompele et al., 2002). The SD of the array generated by the log2-transformed NF ratios was calculated for each NF combination  $(V_n/V_{n+1})$ .  $V_n/V_{n+1}$  were then plotted, representing changes in expression stability of NF. The optimal number of reference genes to exact standards was determined by calculating values as a pair of variation (Vn/Vn + 1) between two normalization factors consecutively classified (NC) after the gradual addition of more subsequent stable reference gene (NFN and NFN + 1), as proposed by Vandesompele et al. (2002), included in GeNorm package. A cut off value <0.15 was adopted (da Costa et al., 2015; Niu et al., 2015; Petriccione et al., 2015; Yang et al., 2015).

## Validation of Reference Gene Analysis

The evaluation of the transcript levels from the RLS gene, encoding the ribulose 1,5-bisphosphate carboxylase/oxygenase (RuBisCO) large subunit, along the imposed temperatures (25/20°C, 31/25°C, 37/30°C, 42/34°C), and under both growth [CO<sub>2</sub>] (380, 700  $\mu$ L CO<sub>2</sub> L<sup>-1</sup>) was analyzed by RT-qPCR, using the most stable vs. the least stable genes (using one, two or three). The RT-qPCR amplification conditions were the same as described above. The relative expression data and

statistical analysis were performed using the REST 2,009 software developed by Pfaffl (Technical University Munich) and Qiagen (Germany). Rest analysis takes into account PCR efficiencies and normalization gene, using the test hypothesis P (H1), i.e., the probability of difference between target and control groups be by chance. P (H1) performs at least 2,000 times of random reallocations of target samples and controls between the groups. Statistical differences were considered significant when P < 0.001 (\*\*\*), P < 0.01 (\*\*), and P < 0.05 (\*).

## **RESULTS AND DISCUSSION**

A total of 10 candidate genes (CG) to obtain an accurate validation of RT-qPCR data were assessed considering the individual comparison groups, i.e., genotype, [CO<sub>2</sub>] and temperature, multiple stress interaction ([CO<sub>2</sub>] and temperature) and total stress interaction (genotype, [CO<sub>2</sub>] and temperature). To determine the specificity of the primer pairs used in this study, melting curve analysis was performed after 40 cycles of amplification. The single peak obtained confirmed the specificity of the amplicon. No signal was detected in the negative controls of all tested primers. The standard curve method using a pool of all cDNA samples was performed to calculate RT-qPCR efficiency (E) and the correlation coefficient  $(R^2)$  of each primer pair (Table 2). The raw quantification cycle (Ct) values ranged from 21.2 to 38.2 across all of the tested samples, with their minimal and maximal means falling between 24.1  $\pm$  1.8 and 34.1  $\pm$  2.1 (**Figure 1**). The results showed that *GAPDH* and  $\alpha$ -*TUB* were the most and least abundantly expressed genes with mean Ct of 24.4 and 30.7, respectively. EF-1A showed the most variable levels of expression. Collectively, these results indicate that the transcript levels of the several candidate genes (CG) varied across different experimental samples confirming the need to screen the most appropriate reference genes for each experimental condition to accurately normalize RT-qPCR gene expression data. This result is common in plants given that most reference genes are involved in functions other than basal cell metabolism (Goulao et al., 2012; da Costa et al., 2015).

According to the Coefficient of Variation (CV) method, the most stable genes were ACT (for genotype and total stress, CV = 5.91 in both cases), UBQ2 (for temperature, CV = 5.50 and  $[CO_2]$ , CV = 5.71), and S15 (for multiple stress, CV = 5.58; Table 3). *EF-1A* was ranked as the least stable gene for genotype (CV = 8.49), temperature (CV = 8.34) and overall stress (CV= 8.49), ranking in the 6th place for [CO<sub>2</sub>] and multiple stress. *DNAJ* and *TUB* were the less stable genes for  $[CO_2]$  (*CV* = 9.68) and multiple stress treatments (7.95). Because the CV method alone is not sufficiently accurate to estimate the stability of the mRNA levels (Goulao et al., 2012), a complementary analysis was performed based on three algorithms, geNorm, NormFinder, and BestKeeper. According to the geNorm algorithm, the average expression stability (M-value) of all CG was below the default limit of 1.5 for genotype, temperature, [CO<sub>2</sub>] and their respective interactions, therefore indicating a considerable high stability level (Table 4). GAPDH was consistently classified as the most stable gene for the five comparison groups while CYCL was the least stable gene for all groups with the exception of genotype,

TABLE 2 | Efficiency values and correlation coefficient for each candidate reference genes under evaluation.

| Gene   | RT-qPCR efficiency% (R <sup>2</sup> ) |            |            |  |  |  |
|--------|---------------------------------------|------------|------------|--|--|--|
|        | CL153                                 | Icatu      | IPR108     |  |  |  |
| GAPDH  | 93.3(0.99)                            | 95.7(0.98) | 93.9(0.98) |  |  |  |
| EF-1A  | 96.3(0.99)                            | 82.7(0.99) | 97.3(0.96) |  |  |  |
| ELF-4A | 90.8(0.99)                            | 90.9(0.98) | 93.3(0.96) |  |  |  |
| CYCL   | 87.1(0.96)                            | 80.3(0.98) | 80.3(0.98) |  |  |  |
| ACT    | 91.4(0.93)                            | 98.7(0.93) | 97.9(0.91) |  |  |  |
| DNAJ   | 82.5(0.99)                            | 86.4(0.99) | 97.7(0.98) |  |  |  |
| S15    | 99.9(0.96)                            | 98.8(0.98) | 90.0(0.95) |  |  |  |
| MDH    | 80.3(0.99)                            | 92.0(0.96) | 92.1(0.97) |  |  |  |
| a-TUB  | 99.3(0.96)                            | 93.4(0.98) | 94.0(0.99) |  |  |  |
| UBQ2   | 98.1(0.97)                            | 91.2(0.93) | 92.2(0.94) |  |  |  |

where *MDH* was the least sable gene. On the other hand, the ranking obtained with NormFinder was clearly dependent on the comparison group: *MDH* was the most stable for genotype, *UBQ2* for temperature, *GAPDH* for  $[CO_2]$  and *ELFA* for multiple and total stress groups. Such differences are due probably to different stability measures, i.e., while geNorm calculates gene expression stability based on the average pairwise expression ratio, NormFinder estimates the overall expression variation to provide individual stability values (Kozera and Rapacz, 2013). Nevertheless, similarly to geNorm, NormFinder also ranked *CYCL* as the least stable gene for all groups, with the exception for genotype (where  $\alpha$ -TUB was the least stable CG).

In order to consolidate the data obtained with geNorm and NormFinder, we have included in the analysis the BestKeeper algorithm, which calculates the expression stabilities of the CG in accordance with SD and CV values. The calculated results classified ACT as the most stable gene for the genotype (together with MDH) and S15 for the [CO<sub>2</sub>] group. For temperature, multiple stress and overall stress groups the most stable gene was MDH.  $\alpha$ -TUB, EF-1A, and CYCL were ranked as the least stable genes, always below the 6th place and usually in the three last positions. Despite the differences between the ranking obtained with the CV method and the three algorithms, which are related to the individual classification criteria, CYCL and  $\alpha$ -TUB were consistently ranked in the bottom five positions.

The consensus ranking obtained with RefFinder (**Table 5**), classified *MDH* as the most stable gene for all comparison groups, therefore constituting a good choice for the studies of *Coffea* spp. under future estimated conditions of increased [CO<sub>2</sub>] and temperature. Furthermore, *ACT* and *S15* were always ranked in the top five positions, while  $\alpha$ -*TUB* and *CYCL* were amongst the least stable genes, as previously found in previous tests (**Tables 3, 4**). *MDH* and *ACT* have been previously described as being amongst the reference genes with higher transcript stability for RT-qPCR studies in *Coffea* spp. subjected to N starvation, salt and heat stresses (Carvalho et al., 2013) and to cold and drought stresses (Goulao et al., 2012), respectively. However, there was no consensus for the majority of candidate reference genes, i.e., the expression stability strongly varied according to



FIGURE 1 | Box plot representing the expression profiling variations of each candidate reference gene. The primer pairs of each gene were used to examine all samples (*n* = 24; **Table 1**). Boxes indicate the 25th and 75th percentiles; *lines across the box* represent the median *Ct*-values; *whisker caps* represent the minimum and maximum values; and *spots* represent the outliers.

TABLE 3 | Ranking of candidate reference genes according to its coefficient of variation (CV%), considering the variables genotype, temperature, [CO<sub>2</sub>] and their interaction.

| Rank | Genoty | Genotypes |        | Temperature |        | [CO <sub>2</sub> ] |        | Multiple stress |        | Total stress |  |
|------|--------|-----------|--------|-------------|--------|--------------------|--------|-----------------|--------|--------------|--|
|      | Gene   | CV        | Gene   | CV          | Gene   | CV                 | Gene   | CV              | Gene   | CV           |  |
| 1    | ACT    | 5.91      | UBQ2   | 5.50        | UBQ2   | 5.71               | S15    | 5.58            | ACT    | 5.91         |  |
| 2    | ELF-4A | 6.49      | S15    | 5.82        | ACT    | 5.73               | ELF-4A | 5.72            | ELF-4A | 6.49         |  |
| 3    | S15    | 6.66      | ACT    | 5.87        | ELF-4A | 5.76               | ACT    | 6.19            | S15    | 6.66         |  |
| 4    | UBQ2   | 6.84      | MDH    | 6.15        | MDH    | 6.64               | MDH    | 6.25            | UBQ2   | 6.84         |  |
| 5    | MDH    | 7.04      | ELF-4A | 6.38        | S15    | 6.65               | DNAJ   | 6.69            | MDH    | 7.04         |  |
| 6    | α-TUB  | 7.17      | DNAJ   | 6.54        | EF-1A  | 6.86               | EF-1A  | 7.15            | a-TUB  | 7.17         |  |
| 7    | DNAJ   | 7.65      | CYCL   | 6.75        | α-TUB  | 6.96               | CYCL   | 7.33            | DNAJ   | 7.65         |  |
| 8    | CYCL   | 7.68      | GAPHD  | 6.93        | CYCL   | 7.52               | UBQ2   | 7.44            | CYCL   | 7.68         |  |
| 9    | GAPHD  | 8.45      | α-TUB  | 7.22        | GAPHD  | 8.94               | GAPHD  | 7.74            | GAPHD  | 8.45         |  |
| 10   | EF-1A  | 8.49      | EF-1A  | 8.34        | DNAJ   | 9.68               | α-TUB  | 7.95            | EF-1A  | 8.49         |  |

the environmental stressful condition, again highlighting the importance of a proper and accurate selection of reference genes for each single experimental condition.

For all comparison groups at V2/V3 the Pairwise variation (V) value was already below 0.15 (**Figure 2**), indicating that the use of two genes guarantee a strong accuracy for the normalization of RT-qPCR data. It is noteworthy to mention that for all treatments the pairwise variation values were <0.10 (except for the use of just one reference gene), indicating low expression instability of the selected genes tested for these environmental conditions.

In order to validate the consensus ranking, we have examined the relative expression of *RLS*, encoding the large-subunit of RuBisCO. The choice of this enzyme was related to its central role in the C-assimilation pathway, considering that improved crop photosynthetic efficiency under high temperature might be achieved through the replacement of a number of candidate amino acid substitutions to improve RuBisCO performance (Orr et al., 2016). Moreover, the *RLS* gene was selected based on the fact that, according to structural-functional analyses, most of the important amino acid residues necessary for catalysis are present in the large subunits (Morita et al., 2014). The consensus ranking established by RefFinder identified *MDH*, *UBQ2*, and *DNAJ* as the best stable genes to temperature, whereas *a*-*TUB*, *CYCL* and *EF-1A* where the least stable ones. Given that the increase in atmospheric temperature has proven to be the most disturbing variable to metabolism performance, mineral nutrition and acclimation limitation under predicted future environmental conditions (Martins et al., 2014, 2016; Rodrigues et al., 2016), with particular strong negative implications to RuBisCO catalytic ability (Rodrigues et al., 2016), we decided to use the most/least stable genes to temperature for *RLS* validation.

The expression profiles were normalized with the two and three most and least stable genes (**Tables 6**, 7), being observed that the expression patterns of *RLS* varied with the comparison TABLE 4 | Stability of candidate reference genes according to GeNorm, NormFinder and BestKeeper, considering the variables genotype, temperature, [CO<sub>2</sub>], and their interaction.

| Group              | Ranking | gel    | Norm      | Norm   | Finder    | BestKeeper |         |
|--------------------|---------|--------|-----------|--------|-----------|------------|---------|
|                    |         | Gene   | Stability | Gene   | Stability | Gene       | R       |
| Genotype           | 1       | GAPDH  | 0.24      | MDH    | 0.005     | ACT        | 0.97**  |
|                    | 2       | ACT    | 0.26      | DNAJ   | 0.009     | MDH        | 0.97**  |
|                    | 3       | EF-1A  | 0.27      | UBQ2   | 0.010     | ELF-4A     | 0.96**  |
|                    | 4       | ELF-4A | 0.28      | S15    | 0.011     | S15        | 0.95**  |
|                    | 5       | UBQ2   | 0.29      | ELF-4A | 0.013     | DNAJ       | 0.93**  |
|                    | 6       | α-TUB  | 0.32      | ACT    | 0.016     | UBQ2       | 0.93**  |
|                    | 7       | S15    | 0.33      | EF-1A  | 0.020     | GAPDH      | 0.93**  |
|                    | 8       | CYCL   | 0.42      | CYCL   | 0.026     | CYCL       | 0.85**  |
|                    | 9       | DNAJ   | 0.53      | GAPDH  | 0.027     | α-TUB      | 0.82**  |
|                    | 10      | MDH    | 0.62      | a-TUB  | 0.030     | EF-1A      | 0.81**  |
| Temperature        | 1       | GAPDH  | 0.14      | UBQ2   | 0.041     | MDH        | 0.98**  |
|                    | 2       | UBQ2   | 0.14      | ELF-4A | 0.057     | DNAJ       | 0.97**  |
|                    | 3       | ELF-4A | 0.16      | GAPDH  | 0.060     | UBQ2       | 0.96*** |
|                    | 4       | ACT    | 0.16      | DNAJ   | 0.071     | ACT        | 0.96*** |
|                    | 5       | S15    | 0.17      | EF-1A  | 0.076     | S15        | 0.95*** |
|                    | 6       | α-TUB  | 0.17      | α-TUB  | 0.082     | ELF-4A     | 0.94*** |
|                    | 7       | DNAJ   | 0.18      | ACT    | 0.083     | EF-1A      | 0.92*** |
|                    | 8       | EF-1A  | 0.18      | MDH    | 0.084     | GAPDH      | 0.91*** |
|                    | 9       | MDH    | 0.19      | S15    | 0.086     | CYCL       | 0.86*** |
|                    | 10      | CYCL   | 0.37      | CYCL   | 0.246     | α-TUB      | 0.84*** |
| [CO <sub>2</sub> ] | 1       | GAPDH  | 0.15      | GAPDH  | 0.019     | CAS15      | 1.00*** |
| [002]              | 2       | UBQ2   | 0.16      | ELF-4A | 0.030     | ACT        | 0.99*** |
|                    | 3       | ELF-4A | 0.17      | UBQ2   | 0.036     | MDH        | 0.99*** |
|                    | 4       | S15    | 0.18      | S15    | 0.070     | ELF-4A     | 0.98*** |
|                    | 5       | α-TUB  | 0.18      | EF-1A  | 0.076     | UBQ2       | 0.98*** |
|                    | 6       | ACT    | 0.19      | α-TUB  | 0.077     | GAPDH      | 0.97*** |
|                    | 7       | EF-1A  | 0.19      | ACT    | 0.082     | DNAJ       | 0.94**  |
|                    | 8       | MDH    | 0.23      | MDH    | 0.105     | α-TUB      | 0.94    |
|                    | 9       | DNAJ   | 0.31      | DNAJ   | 0.180     | EF-1A      | 0.91*   |
|                    | 10      | CYCL   | 0.53      | CYCL   | 0.357     | CYCL       | 0.91    |
| Multiple stress    | 1       | GAPDH  | 0.16      | ELF-4A | 0.028     | MDH        | 0.97*** |
|                    | 2       | ELF-4A | 0.16      | UBQ2   | 0.053     | DNAJ       | 0.96*** |
|                    | 3       | α-TUB  | 0.17      | α-TUB  | 0.060     | S15        | 0.96*** |
|                    | 4       | ACT    | 0.18      | GAPDH  | 0.062     | ELF -4A    | 0.96*** |
|                    | 5       | UBQ2   | 0.18      | DNAJ   | 0.074     | ACT        | 0.95*** |
|                    | 6       | S15    | 0.18      | ACT    | 0.077     | EF-1A      | 0.90*** |
|                    | 7       | DNAJ   | 0.20      | S15    | 0.082     | UBQ2       | 0.90*** |
|                    | 8       | MDH    | 0.20      | MDH    | 0.094     | GAPDH      | 0.88*** |
|                    | 9       | EF-1A  | 0.27      | EF-1A  | 0.164     | CYCL       | 0.83*** |
|                    | 10      | CYCL   | 0.43      | CYCL   | 0.288     | α-TUB      | 0.50*   |
| Total stress       | 1       | GAPDH  | 0.16      | ELF-4A | 0.040     | MDH        | 0.97*** |
|                    | 2       | UBQ2   | 0.18      | UBQ2   | 0.044     | S15        | 0.96*** |
|                    | 3       | ELF-4A | 0.18      | GAPDH  | 0.055     | ELF-4A     | 0.95*** |
|                    | 4       | S15    | 0.19      | S15    | 0.085     | ACT        | 0.95*** |
|                    | 5       | ACT    | 0.19      | ACT    | 0.095     | DNAJ       | 0.93    |
|                    |         |        |           |        |           |            | 0.94    |
|                    | 6       | α-TUB  | 0.22      | DNAJ   | 0.105     | UBQ2       | 0.93*** |
|                    | 7       | DNAJ   | 0.23      | MDH    | 0.111     | GAPDH      |         |
|                    | 8       | MDH    | 0.23      | α-TUB  | 0.112     | CYCL       | 0.82*** |
|                    | 9       | EF-1A  | 0.24      | EF-1A  | 0.123     | EF-1A      | 0.79*** |
|                    | 10      | CYCL   | 0.44      | CYCL   | 0.295     | α-TUB      | 0.73*** |

For sake of simplicity, only significant differences were indicated (\*\*\*P < 0.001; \*P < 0.01; \*P < 0.05) related to the BestKeeper test.

| Genotypes |       | Temperature |       | [co    | [CO <sub>2</sub> ] |        | Multiple stress |        | Total stress |  |
|-----------|-------|-------------|-------|--------|--------------------|--------|-----------------|--------|--------------|--|
| MDH       | 1.68  | MDH         | 1.86  | MDH    | 1.68               | MDH    | 1.41            | MDH    | 1.41         |  |
| S15       | 1.86  | UBQ2        | 1.86  | S15    | 1.78               | ELF-4A | 2.21            | ACT    | 1.57         |  |
| ACT       | 2.99  | DNAJ        | 2.11  | UBQ2   | 2.71               | DNAJ   | 2.63            | S15    | 2.78         |  |
| DNAJ      | 3.34  | ACT         | 3.46  | ACT    | 2.83               | S15    | 2.78            | DNAJ   | 3.94         |  |
| ELF-4A    | 3.83  | S15         | 3.98  | ELF-4A | 4.40               | ACT    | 4.40            | ELF-4A | 4.95         |  |
| UBQE2     | 5.05  | ELF-4A      | 6.24  | GAPDH  | 6.82               | GAPDH  | 6.64            | UBQ2   | 5.05         |  |
| GAPDH     | 7.00  | GAPDH       | 6.74  | EF-1A  | 7.00               | UBQ2   | 6.74            | GAPDH  | 7.00         |  |
| CYCL      | 8.00  | EF-1A       | 8.24  | a-TUB  | 8.00               | CYCL   | 8.00            | CYCL   | 8.00         |  |
| EF-1A     | 9.00  | CYCL        | 8.74  | CYCL   | 8.80               | EF-1A  | 9.15            | a-TUB  | 9.24         |  |
| a-TUB     | 10.00 | a-TUB       | 10.00 | DNAJ   | 9.00               | a-TUB  | 9.24            | EF-1A  | 9.74         |  |
|           |       |             |       |        |                    |        |                 |        |              |  |

TABLE 5 | Overall ranking of the most stable genes within each treatment made through RefFinder program, considering the variables genotype, temperature, [CO<sub>2</sub>] and their interaction.



group. Noticeably, due to the high SD of Ct values in many cases variations in RLS expression along the stress imposition were not reported as statistically significant. The patterns of RLS expression were nearly the same in RT-qPCR reactions calibrated with two or three genes. Independently of the stability of RLS mRNA, the increase in temperature generally resulted in upregulation of RLS expression at standard [CO<sub>2</sub>] of 380 µL CO<sub>2</sub>  $L^{-1}$  in all genotypes, except in IPR108 at  $31/25^{\circ}$  and  $37/30^{\circ}C$ where RLS expression was nearly the same as the control. For the 700  $\mu$ L CO<sub>2</sub> L<sup>-1</sup> comparison group, the use of the most stable reference genes produced different results from those obtained with the least stable genes at  $25/20^{\circ}$  and  $31/25^{\circ}$ C. Thus, when reactions were normalized with the most stable genes, a consistent decrease in the steady-state amounts of RLS mRNA (which is the net result of transcription and degradation) was observed at these temperatures in all genotypes, while the use of the least stable genes indicated a positive regulation of RLS expression. For 37/30°C and 42/34°C, normalization of RTqPCR with the most or the least stable genes produced similar up-regulated expression patterns of RLS. Notably, such an upregulation occurred when RuBisCO activity begin to decrease  $(37/30^{\circ}C)$  or was severely depressed  $(42/34^{\circ}C)$  (Rodrigues et al., 2016). Such apparent discrepancy was also noted in chloroplastic ascorbate peroxidase (APX). APX activity was the most reduced (to about 10% of the control) at 42/34°C among the studied enzymes, contrasting to the largest increase in *APX* transcripts amongst all studied genes (Martins et al., 2016). Such large increases in gene transcripts may be related to an attempt of the plants to compensate the severe decline of enzyme activity, and further highlights the need of integrated experiments that include gene expression and enzyme activity studies.

Given the facts described above, the reference genes used in this study were quite stable under the applied experimental conditions, as pairwise variation values were <0.10. The results obtained in the groups 700-25/20°C and 700-31/25°C call up for the importance to select the best reference genes. Altogether, despite the low instability of *a*-*TUB*, *CYCL*, and *EF*-1*A*, the use of reference genes showing a high stability of their mRNA amount is the best option for the correct interpretation of data from transcriptional studies (Roy et al., 2011; Kozera and Rapacz, 2013). Also importantly, this corroborates with previous studies in *Coffea* sp., which indicate that the selection of reference genes TABLE 6 | Analysis of *RLS* expression by RT-qPCR, calibrated with the two most (*MDH* and *UBQ2*) and the two least (*a-TUB* and *CYCL*) genes for the temperature group/treatment.

TABLE 7 | Analysis of *RLS* expression by RT-qPCR, calibrated with the three most (*MDH*, *UBQ2* and *DNAJ*) and the three least (*a-TUB*, *CYCL* and *EF-1A*) genes for the temperature group/treatment.

| Re       | eference genes       |     | MDH and UBQ2   | a-TUB and CYCL        |  |
|----------|----------------------|-----|----------------|-----------------------|--|
| Genotype | Genotype Temperature |     | RLS expression | <b>RLS</b> expression |  |
| CL 153   | 25/20°C              | 380 | 1.00           | 1.00                  |  |
|          |                      | 700 | 0.361          | 1.768                 |  |
|          | 31/25°C              | 380 | 1.353          | 5.665                 |  |
|          |                      | 700 | 0.504          | 3.559                 |  |
|          | 37/30°C              | 380 | 1.581          | 12.556                |  |
|          |                      | 700 | 1.467          | 12.86                 |  |
|          | 42/34°C              | 380 | 4.565          | 25.922                |  |
|          |                      | 700 | 8.889          | 25.114                |  |
| Icatu    | 25/20°C              | 380 | 1.00           | 1.00                  |  |
|          |                      | 700 | 0.781          | 1.553                 |  |
|          | 31/25°C              | 380 | 1.900**        | 3.604*                |  |
|          |                      | 700 | 1.505          | 2.546*                |  |
|          | 37/30°C              | 380 | 3.423*         | 6.957*                |  |
|          |                      | 700 | 2.776*         | 5.742*                |  |
|          | 42/34°C              | 380 | 5.220*         | 19.923*               |  |
|          |                      | 700 | 7.097*         | 32.153*               |  |
| IPR 108  | 25/20°C              | 380 | 1.00           | 1.00                  |  |
|          |                      | 700 | 0.249*         | 0.603                 |  |
|          | 31/25°C              | 380 | 0.778          | 1.345                 |  |
|          |                      | 700 | 0.801*         | 1.720*                |  |
|          | 37/30°C              | 380 | 0.844          | 1.851***              |  |
|          |                      | 700 | 1.070          | 2.172                 |  |
|          | 42/34°C              | 380 | 4.940*         | 21.732**              |  |
|          |                      | 700 | 1.399          | 4.01                  |  |

For sake of simplicity, only significant differences were indicated (\*\*\*P < 0.001; \*\*P < 0.01; \*P < 0.05).

for an accurate RT-qPCR normalization should be performed accordingly to each for specific condition (Cruz et al., 2009; Goulao et al., 2012; Carvalho et al., 2013; Yuyama et al., 2016).

# CONCLUSIONS

In summary, our study reinforces the importance of the *Minimum Information for Publication of Quantitative Real-Time PCR Experiments* (MIQE) guidelines (Bustin et al., 2009) to normalize RT-qPCR data. The consensus ranking obtained with RefFinder showed that the transcript stability of the evaluated reference candidate genes changed according to the conditions/interactions, although *MDH* was the best one in all treatments, therefore, constituting a good common basis for RT-qPCR data normalization. However, the Pairwise variation analysis showed the need to use two reference genes, with the second most stable gene changing according to the genotypes and imposed environmental conditions: *S15* for genotype and [CO<sub>2</sub>], *UBQ2* for temperature, *EJF-4A* for multiple stress, and *ACT* for multiple stress. Using the expression profiles of coffee *RLS*, results from the *in silico* aggregation and experimental validation

| Re       | eference genes |                    | MDH, UBQ2,<br>and DNAJ | α-TUB, CYCL<br>and EF-1A<br>RLS expressior |  |
|----------|----------------|--------------------|------------------------|--|--|
| Genotype | Temperature    | [CO <sub>2</sub> ] | RLS expression         |  |  |
| CL 153   | 25/20°C        | 380                | 1.00                   | 1.00                                       |  |
|          |                | 700                | 0.410                  | 1,347                                      |  |
|          | 31/25°C        | 380                | 1,424                  | 2,780                                      |  |
|          |                | 700                | 0.522                  | 1,747                                      |  |
|          | 37/30°C        | 380                | 1,730                  | 5,701                                      |  |
|          |                | 700                | 1,435                  | 6,357                                      |  |
|          | 42/34°C        | 380                | 4,214                  | 10,853                                     |  |
|          |                | 700                | 6,527                  | 10,782                                     |  |
| Icatu    | 25/20°C        | 380                | 1.00                   | 1.00                                       |  |
|          |                | 700                | 0.744                  | 1,449                                      |  |
|          | 31/25°C        | 380                | 1.608*                 | 2.807**                                    |  |
|          |                | 700                | 1,215                  | 2.170*                                     |  |
|          | 37/30°C        | 380                | 2.726*                 | 5.250*                                     |  |
|          |                | 700                | 2.219*                 | 3.955*                                     |  |
|          | 42/34°C        | 380                | 4.087*                 | 9.637*                                     |  |
|          |                | 700                | 5.389*                 | 12.979*                                    |  |
| IPR 108  | 25/20°C        | 380                | 1.00                   | 1.00                                       |  |
|          |                | 700                | 0.249*                 | 1,059                                      |  |
|          | 31/25°C        | 380                | 0.697*                 | 1.307*                                     |  |
|          |                | 700                | 1,123                  | 2.865*                                     |  |
|          | 37/30°C        | 380                | 0.759                  | 1,495                                      |  |
|          |                | 700                | 1,093                  | 3,453                                      |  |
|          | 42/34°C        | 380                | 4.950*                 | 11.012*                                    |  |
|          |                | 700                | 1,759                  | 4,645                                      |  |

For sake of simplicity, only significant differences were indicated (\*\*\*P < 0.001; \*\*P < 0.01; \*P < 0.05).

confirmed that the use of two reference genes is an adequate procedure to normalize RT-qPCR data.

# **AUTHOR CONTRIBUTIONS**

According to their competences, all authors contributed transversally to the several stages of the work, including its design, data acquisition, analysis and interpretation, critically review of the manuscript, and approval of the submitted version. Furthermore, they agree to be accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work were appropriately investigated and resolved.

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**Conflict of Interest Statement:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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