

Validation of Reference Genes Across Populations of *Aphis glycines* (Hemiptera: Aphididae) for RT-qPCR Analysis of Gene Expression Related to Pyrethroid Detoxification¹

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J. Entomol. Sci. 57(2): 213–239 (April 2022)

Abstract Metabolic detoxification is a common mechanism of insecticide resistance, in which detoxifying enzyme genes are overexpressed. *Aphis glycines* Matsumura (Hemiptera: Aphididae) is one of the major soybean pests in the United States and has developed resistance to pyrethroid insecticides after almost two decades of use. To date, there are no validated reference genes to normalize expression of detoxification genes for pyrethroid resistance in *A. glycines*. From a literature review, a list was compiled of genes from 36 gene families (68 sequences) frequently used as reference genes in gene expression analysis in Hemiptera. Exon–exon junction primers were designed for the best alignment matches to a draft *A. glycines* genome and were assayed in a three-phase screening. The first screen eliminated nonamplifying primers. The second screen used nine *A. glycines* populations varying in resistance to pyrethroids and eliminated primers with inconsistent amplification or low amplification efficiency, and quantitatively assessed the stability of expression in the 14 remaining candidates using NormFinder and a generalization of BestKeeper. The third screen quantitatively validated these results on the best candidates. Six genes were identified with the greatest stability across technical and biological replication and the nine populations. The genes identified as the most suitable reference genes for the study of detoxifying enzymes related to pyrethroid resistance in soybean aphid were: actin, *RPL9* (ribosomal protein L9), *RPS9* (ribosomal protein S9), *AK* (arginine kinase), *RNAPol2* (RNA polymerase II), and *RPL17* (ribosomal protein L17). Our findings will support studies related to insecticide resistance in *A. glycines*.

Key Words resistance, housekeeping genes, P450, soybean aphid, normalization

Soybean, *Glycine max* (L.) Merrill, is an important commodity crop in the U.S. economy. The major insect pest affecting soybean in the North Central Region of the United States and southeast Canada is soybean aphid, *Aphis glycines* Matsumura (Hemiptera: Aphididae) (Ragsdale et al. 2011). Since the detection of *A. glycines* in 2000 in the United States (Hartman et al. 2001), chemical control has been the most widely used control tactic (Hodgson et al. 2012, Koch et al. 2018). Reliance on the few insecticide groups available, primarily pyrethroids and

¹Received 21 June 2021; accepted for publication 26 July 2021.

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organophosphates, favored the selection of *A. glycines* resistance to pyrethroids (Hanson et al. 2017, Koch et al. 2018, Menger et al. 2020). Several mechanisms of resistance to insecticides have been documented in insects. Among these mechanisms is metabolic resistance (Feyereisen 1995), which results from the overexpression of detoxification enzymes, such as cytochrome P450 monooxygenases, glutathione-S-transferases, and esterases (E4 and CES) (Coppin et al. 2012, Panini et al. 2016). For *A. glycines*, there is evidence of metabolic resistance to pyrethroids in China (Xi et al. 2015) and in the United States (Paula et al. 2020). Metabolic resistance is the most common mechanism of insecticide resistance, and it can present a considerable challenge in insecticide resistance management (IRAC - Insecticide Resistance Action Committee 2019). Therefore, the monitoring of metabolic resistance is imperative to improve integrated pest management (IPM) programs (Li et al. 2016) for a pest such as *A. glycines* with a pyrethroid resistance history.

Real-time reverse transcription–quantitative polymerase chain reaction (RT-qPCR) is a sensitive, practical, and low-cost tool for expression analysis of detoxification genes (Bansal et al. 2012, Kozera and Rapacz 2013). An essential component of gene expression analysis by RT-qPCR is the selection and validation of appropriate reference genes (Huggett et al. 2005, Koramutla et al. 2016). Reference genes serve as endogenous or internal controls to normalize variability in the RT-qPCR signal across samples, usually introduced in the RNA extraction, complementary DNA (cDNA) synthesis, or PCR stages (Huggett et al. 2005, Kozera and Rapacz 2013), because they have constitutive expression that is not affected by the experimental conditions or treatments (Yang et al. 2014a) or the population to which the organism belongs (Lu et al. 2013, Sun et al. 2010). They are generally housekeeping genes (HKGs), so called because they are responsible for basic cell metabolism, among other functions (Butte et al. 2001, Thellin et al. 1999). Nevertheless, since it has been demonstrated that expression of HKGs may vary in certain circumstances in response to diverse biotic or abiotic factors (Thellin et al. 1999), it became advisable to use multiple reference genes (Lü et al. 2018, Radonić et al. 2004, Vandesompele et al. 2002).

According to Lü et al. (2018), the most common reference genes used in gene expression analysis in insects are: actin (main groups: alpha, beta, and gamma), ribosomal protein L (*RPL*), tubulin, elongation factor 1 alpha (*EF1a*), glyceraldehyde-3 phosphate dehydrogenase (*GAPDH*), ribosomal protein S (*RPS*), TATA-box binding protein (*TBP*), 18S ribosomal RNA (*18S*), heat shock protein (*HSP*), and succinate dehydrogenase subunit A (*SDHA*). However, their common use does not assure their validity as reference genes as their expression stability may vary in different insect species and experimental conditions (Gutierrez et al. 2008). Several reference genes were validated for many gene expression analyses in aphids, e.g., *Acyrtosiphon pisum* (Harris) (Yang et al. 2014a), *Aphis gossypii* Glover (Ma et al. 2016), and *Myzus persicae* (Sulzer) (Kang et al. 2017), including *A. glycines* (Bansal et al. 2012). However, reference genes have not yet been identified for the study of expression of detoxification genes related to pyrethroid resistance in *A. glycines*.

To accurately quantify and monitor the incidence of metabolic resistance to pyrethroids in field populations of *A. glycines*, this work aimed to identify reference genes across nine populations varying in resistance to pyrethroids. This

assessment was performed as a three-phase screening for stability of expression of candidate reference genes from 36 gene families (68 sequences). Our results will provide a fundamental base for additional study of gene expression analysis in *A. glycines* under different levels of pyrethroid resistance.

Materials and Methods

Soybean aphids. Nine populations of *A. glycines* were studied. The populations were: (1) a laboratory susceptible control population (Biotype 1, previously shown to be insecticide susceptible [Hanson et al. 2017]) and field-collected populations from (2) Sutherland (IA), (3) Lamberton (MN), (4) Howard Lake (MN), (5) Rosemount (MN), (6) Fairfax (MN), (7) St. Paul (MN), (8) Rochester (MN) in 2019, and (9) Hancock (MN) in 2018. The field-collected populations from 2019 were collected from one infested soybean plant at each of five locations per field, with locations spaced at least 20 m apart. The Hancock population was collected in 2018 from a few plants within 0.5 m of each other at one location in the field. The pyrethroid (lambda-cyhalothrin) resistance of each field-collected population was characterized by a LC₉₉ glass-vial bioassay (Menger et al. 2020). Clonal populations were started from survivors of the initial bioassays for each field-collected population, except for Howard Lake. All these populations were maintained in a greenhouse (University of Minnesota) in 60-cm² cages containing healthy soybean plants (SD01-76R cultivar) at 25 ± 2°C, 18–22% relative humidity, and 16:8 h (L:D) photoperiod. For each clonal population, the level of pyrethroid (lambda-cyhalothrin) resistance was assessed with the abovementioned LC₉₉ glass-vial bioassay. Tukey's test (P, 0.05) was performed to compare the mean proportion mortality among populations. From the clonal populations, apterous adult aphids were collected from the plants in the colonies and preserved for further work. For the Howard Lake population, apterous adult aphids were collected and preserved directly from the initial bioassay (i.e., a clonal population was not developed for this population). Three biological replicates from each of the nine populations (27 *A. glycines*) were studied for gene expression. Prior to preservation, aphids were inspected with a dissecting microscope, using RNase-free materials, to select only intact apterous adults. Individuals were transferred to 1.5-ml microtubes, flash-frozen in liquid nitrogen, submerged in RNA_{later}, and stored at –80°C.

Selection of the candidate reference genes and primer design. The literature was searched for candidate reference genes for RT-qPCR studies, and 36 gene families (68 sequences) were selected (Table 1) from nine aphids and one psyllid species: *Aphis craccivora* Koch (Yang et al. 2015), *A. glycines* (Bansal et al. 2012), *A. gossypii* (Ma et al. 2016), *Diuraphis citri* Kuwayama (Bassan et al. 2017), *Diuraphis noxia* (Mordvilko) (Sinha and Smith 2014), *Lipaphis erysimi* (Kaltenbach) (Koramutla et al. 2016), *Megoura viciae* Buckton (Cristiano et al. 2016), *Myzus persicae* (Kang et al. 2017), *Rhopalosiphum padi* (L.) (Wu et al. 2014), and *Toxoptera citricida* (Kirkaldy) (*Aphis citricidus* (Kirkaldy)) (Shang et al. 2015). Using their GenBank accession numbers, the nucleotide sequences were retrieved and used as queries to search for orthologous *A. glycines* sequences within the database consisted of contigs from the “Genome Assembly v1.0 of *Aphis glycines*, Biotype 4 (Ag_bt4)” (Wenger et al. 2017) available in the “*A. glycines* blast server”

Table 1. Candidate genes initially considered to screen/mine reference genes for the study of gene expression of detoxifying enzymes associated with pyrethroid resistance in *Aphis glycines*. Except *Diaphorina citri* (Hemiptera: Psyllidae), all the other species are aphids.

Species and Gene	GenBank Accession Number	Reference
<i>Aphis craccivora</i>		
12S ribosomal RNA	GAJW01000011	(Yang et al. 2015)
18S ribosomal RNA	GAJW01000254	
70 heat shock protein	GAJW01000112	
Elongation factor 1 α	KC897473	
NADH-ubiquinone oxidoreductase	GAJW01000104	
Ribosomal protein L11	GAJW01000099	
Ribosomal protein L14	GAJW01000046	
Ribosomal protein S8	GAJW01000269	
Ribosomal protein S23	GAJW01000179	
Vacuolar type H ⁺ -ATPase	GAJW01000023	
<i>Aphis glycines</i>		
Elongation factor 1 α	JQ654778	(Bansal et al. 2012)
Glyceraldehyde-3-phosphate dehydrogenase	JQ654777	
Helicase	JQ654779	
Ribosomal protein S9	JQ654782	
Stromal cell-derived factors	JQ654783	
TATA-box binding protein	JQ654781	
<i>Aphis gossypii</i>		
18S ribosomal RNA	KF018922.1	(Ma et al. 2016)
28S ribosomal RNA	KC796354.1	
α -Tubulin	KP676379	
β -Actin	KF018928.1	
Elongation factor 1 α	EU019874.1	
Glyceraldehyde-3-phosphate dehydrogenase	KP676380	
Ribosomal protein L7	KP676382	
TATA-box binding protein	AGT79997.1	

Table 1. Continued.

Species and Gene	GenBank Accession Number	Reference
<i>Diaphorina citri</i>		
Ribosomal protein L17	NM_001297694.1	(Bassan et al. 2017)
<i>Diuraphis noxia</i>		
Actin-5C	XM_015517697	(Sinha and Smith 2014)
Ribosomal protein L5	AB914563	
Ribosomal protein L9	AB914565	
Ribosomal protein L27	AB914564	
Elongation factor 1 α	AB914566	
<i>Lipaphis erysimi</i>		
16S ribosomal RNA	FJ411411	(Koramutla et al. 2016)
18S ribosomal RNA	NM_001126217.2	
β -Tubulin	NM_001190398	
Actin	NM_001126200	
Arginine kinase	XM_008187305.1	
Elongation factor 1 α	XM_008184147.1	
Glyceraldehyde-3-phosphate dehydrogenase	NM_001293474.1	
Ribosomal protein L13	XM_001949594.3	
Ribosomal protein L27	NM_001126221.2	
Ribosomal protein L29	XM_001943721.3	
Succinate dehydrogenase B	NM_001162436	
<i>Megoura viciae</i>		
β -Tubulin	XM_008191981.1	(Cristiano et al. 2016)
Actin	NM_001142636.1	
Nicotinamide adenine dinucleotide	XM_001946205.2	
Ribosomal protein L32	NM_001126210.2	
Ribosomal protein S9	XM_001945492.3	
TATA-box binding protein	NM_00162717.2	
Ubiquinone	XM_001950304.2	
Ubiquitin	NM_001126205.2	

Table 1. Continued.

Species and Gene	GenBank Accession Number	Reference
<i>Myzus persicae</i>		
18S ribosomal RNA	AF487712.1	(Kang et al. 2017)
β -Tubulin	XM_022309483.1	
Actin	XM_022309797.1	
Acetylcholinesterase-like	XM_022319367.1	
Glyceraldehyde-3-phosphate dehydrogenase	XM_022315441.1	
Ribosomal protein L7	XM_022312633.1	
Ribosomal protein L27	XM_022325621.1	
Ribosomal protein L32	XM_022324450.1	
Elongation factor 1 α	EU358933	(Kim and Lee 2008)
<i>Rhopalosiphum padi</i>		
18S ribosomal RNA	KJ612093	(Wu et al. 2014)
Actin 1	KJ612090	
Elongation factor 1 α	KJ612092	
Glyceraldehyde-3-phosphate dehydrogenase	KJ612091	
<i>Toxoptera citricida</i> (<i>Aphis citricidus</i>)		
18S ribosomal RNA	AY216697.1	(Shang et al. 2015)
α -Tubulin	KP260944	
β -Actin	KP260943	
Elongation factor 1 α	EU358941.1	
Glyceraldehyde-3-phosphate dehydrogenase	KP260945	
RNA polymerase II	KP260942	

supported by the Bioinformatics Platform for Agroecosystem Arthropods (bipaa.genouest.org/sp/aphis_glycines/blast). For the search, BLASTx 2.6.0+ (Altschul et al. 1997) was used with default parameters. Considering only the best alignment matches, 32 gene candidate sequences were obtained (from 26 gene families) (Table 2). Exon and intron positions were identified using AUGUSTUS (<http://bioinf.uni-greifswald.de/augustus/submission>) to design exon–exon junction primer-pairs.

Table 2. Primer-pairs used to select candidate reference genes for the expression analysis of detoxification enzymes in *Aphis glycines*. These genes were selected based on other housekeeping genes used in other studies, mainly with aphids (Table 1). The primer-pairs highlighted in bold ($n=30$) are the ones selected for the second screening phase by reverse transcription-quantitative polymerase chain reaction (RT-qPCR).*

Gene and GenBank Accession Number	Primer Name	Efficiency (%)	R^2	Primer Forward (5'→3')	Primer Reverse (5'→3')
60S variant 1: MT332164	Agl_60S_a_v1	1.877	0.894	TCACGTCGGTGGTGGT	GGTCCTTAAGGCTAACCTCTTT
	Agl_60S_b_v1	1.952	0.593	GCCAAAGTCAAAGAATCATACC	TTTGACAAACACCACGAC
60S variant 2: MT332185	Agl_60S_a_v2	1.938	0.888	GAAGAACTGTCCGTGGTATG	CTCATGGCCAAAGGTACAA
	Agl_60S_b_v2	1.901	0.953	ACTGTGATGTTGGTCGTTTTATC	GGCTTCTCTGGTCAATTTATGT
α -Tubulin variant 1: MT332192	Agl_α-Tubulin_a_v1	1.865	0.706	GAGCAACTGATTACTGGCAA	CACCGAACGAGTGGAAATATC
	Agl_ α -Tubulin_b_v1	1.926	0.499	AGACGACAGTTTCAACACG	TCCTTGGCCAGTAATCAGTTG
α -Tubulin variant 2: MT332196	Agl_α-Tubulin_a_v2	1.886	0.937	GAGGACCCAGAAATACAAATGA	GTCTTGGTGAAGTTTGTCT
β -Actin: MT332180†	Agl_β-Actin_a†	1.916	0.904	GAAGTAGCTGCATTGGTAGTAG	AACCATGACTCCCTGATGA
	Agl_ β -Actin_b	1.877	0.899	CCATTGGAAATGAAAGATTCCG	TGGTACCTCCAGACAATACA
β -Tubulin variant 1: MT332169	Agl_Tubulin- β 1_a_v1	1.902	0.879	TAGACGTAGTCAGGAAAGAGG	GTCAATAATCTGTCCGGGTATT
	Agl_Tubulin-β1_b_v1	1.811	0.973	CTCTGGTATGGAAACACTTATG	TCGGATACCTTTGGGTGAA
β -Tubulin variant 2: MT332183	Agl_ β -Tubulin_a_v2	0.000	0.746	GGCCCATTCGGTCAATAT	CCTCAGCTCTTTCCTAACTAC
	Agl_β-Tubulin_b_v2	1.882	0.916	GTAGTAGGAAAGAAGCTGAGG	CATAATGCGGTCTGGGTAAT
γ -Tubulin: MT332197	Agl_ γ -Tubulin_b	1.869	0.969	ATATGCAATTCGGGAGTCTATG	TGGCGTTAAGTCAGGTTTAC
	Agl_γ-Tubulin_v2	1.869	0.969	ATATGCAATTCGGGAGTCTATG	TGGCGTTAAGTCAGGTTTAC
<i>ACHe</i> : MT332191	Agl_ACHe_a	2.013	0.895	CCAAACGGCCGAAGAAATA	AAATTCAGATCTCCGTCTATGG
	Agl_ACHe_b	1.997	0.808	TACGGCCATTCAAAGAGTATG	CACAAATCGTCCAAACCGATAA

Table 2. Continued.

Gene and GenBank Accession Number	Primer Name	Efficiency (%)	R ²	Primer Forward (5'→3')	Primer Reverse (5'→3')
Actin: MT332161 [†]	Agl_Actin_a	1.763	0.799	CGACGATTCGACAAGGATTT	ACTGTAAACGGACTTTGCG
	Agl_Actin_b[†]	1.824	0.909	CTCGATCACGATCGCAAGTTTA	CGACTACCAAAGCTGCTACATC
AK: MT332182 [†]	Agl_Arginine-Kinase_a[†]	2.041	0.915	CGATTTCTACAGGCTGCTAATG	CCTCCTTGTTCATCGATATG
	Agl_Arginine-Kinase_b	1.909	0.764	GCTGGGACAAAAGCTAAA	CTCAGTCAAAACCCATTCTTCTC
<i>EF1α</i> variant 1: MT332174	Agl_EF1_a_v1	1.928	0.974	ACTCCAGGACGCTACAAA	TGCATCTCCACGGACTTA
	Agl_EF1_b_v1	1.897	0.833	CATGGTTCAAGGGATGGAATG	TTTGTAGACGTCCTGGAGTG
Alpha-tubulin	Agl_ATAT1_a_X2	1.904	0.971	ATCGATGAGATGGGCAAAAG	CACTGAAATGTTCTGGTTTATCG
N-acetyltransferase 1-like isoform X2: MT332187	Agl_ATAT1_B_X2	1.946	0.976	CGATAAACCCAGAACATTTCAAGTG	TCCATAACCTTTTACGCTGTTT
<i>EF2</i> : MT332165	Agl_EF2_a	1.873	0.957	TGCAGTAGGAGGTATCTACAG	ATCAGCAGTGAATCCGAAAAG
	Agl_EF2_b	1.846	0.931	CGCTCTTGGTGTAAAGAACT	GGTCCCATAAACGAGCTTTC
<i>GAPDH3</i> variant 1: MT332189	Agl_GAPDH3_a_v1	1.864	0.908	GGTGATACCCACTCATCAATC	TCATTGTCGTACCATGAGATAAG
	Agl_GAPDH3_b_v1	1.877	0.861	GTTGTTGATTTGACTGTAAAGACTTG	GAGTGGGTATCACCAATGAAAT
<i>GAPDH3</i> variant 2: MT332190	Agl_GAPDH3_a_v2	1.944	0.720	GCATCAACGATCCATTCATTAG	TGGACAGCACTTGTAATCAG
	Agl_GAPDH3_b_v2	1.866	0.947	TGATTACAAGTGCTGTCCAA	GAAAACATTAGCAACTGGAACCTC
Helicase: MT332181	Agl_Helicase_a	1.685	0.539	GGGAAATCCACAGGAAAGAA	GCCTCGTGAGAACCAAAATA
	Agl_Helicase_b	1.881	0.958	CGCCTTAAACGAGCAGATT	AAAGGAGGAAAGTTGTGTTGG
<i>HSP70</i> : MT332198	Agl_HSP70	1.849	0.890	ATGGGTAATGATGTAGCAGAAA	GGTGACATACGGGAAAGTTG
<i>RPL9</i> : MT332163 [†]	Agl_RPL9_a	1.841	0.953	TCAACAGTTCAACAGGACTTTA	CGGACTTTCCTCAACATCATAG
	Agl_RPL9_b[†]	1.886	0.963	TGTTGAAGGATTAGGTCATCAAG	CTAGGTTTCTCTTCGCTTTGG

Table 2. Continued.

Gene and GenBank Accession Number	Primer Name	Efficiency (%)	R ²	Primer Forward (5'→3')	Primer Reverse (5'→3')
<i>RNAPol2</i> variant 1: MT332167	AgI_RNAPol2_v1	1.906	0.909	GGACCATTGCCAGAACAAATA	CTTCTCGTGAATATCACCTAACC
<i>RNAPol2</i> variant 2: MT332186 [†]	AgI_RNAPol2_a_v2[†] AgI_RNAPol2_b	1.925 1.829	0.926 0.936	GTTAGCCCTACTCATCCTAAAG CTGGTCTGTACACATATT	CTAGTTCATCACCTCCTTCAC TTGCATTGCTCTTTGGTAGG
<i>RPL5</i> : MT332193	AgI_RPL5_a AgI_RPL5_b	2.071 1.979	0.805 0.757	GTCGCCGATGATTTGGAA GTTGCTGCGCGATTATTGA	TTAGCGTTCAGCGGTTTAG TCTAGATTGCAACGGAAAGC
<i>RPL7</i> : MT332184	AgI_RPL7_a AgI_RPL7_b	1.851 1.871	0.877 0.956	CGGTAGTCAGTACTAACCTCAA GCGTATTGTTGGTGAAT	TTGGAGCATTGTCATCAACC CCCAAGTCACATATGGTTCA
<i>RPL14</i> : MT332170	AgI_RPL14_a	1.914	0.952	TCCACTTGACCAAGTTTAAGAT	AAAGATGCACGCTTCTCC
<i>RPL17</i> : MT332188 [†]	AgI_RPL14_b AgI_RPL17_a[†]	1.897 1.928	0.998 0.869	GGCCCGTAAACACGTA AA CACTTCAAGAACACGAGAGAG	GTTTAGCTTCAACTCCAACCTTT GCCATTGAACCTCCTGAAA
<i>RPL27</i> : MT332162	AgI_RPL17_b AgI_RPL27_a	1.911 1.920	0.860 0.919	GTCGTATTAACCCGTACATGAG CCGCGAATACTTGGCATT	CCTCATCCTTGGGAACCTTAG ATTGTGCCGATTTGTGCT
<i>RPS8</i> : MT332194	AgI_RPL27_b AgI_RPS8_a	1.892 1.865	0.960 0.843	CAGCACAAATCGGCACAAATG TGCCAAATTGACCCGAAAT	TTGTCTTTCCGCTGTACCTTC ACGTCCGGTCATGAATTG
<i>RPS9</i> : MT332178 [†]	AgI_RPS8_b AgI_RPS9_a[†]	1.909 2.004	1.000 0.799	CCTCAGAAAAGAGGAAAGTT GGAGAGTATGGTCTGAGAAAATAAG	GTACGAACTGTGTGGATTCT CGCAACAAAAGCATTACCTTC
	AgI_RPS9_b	0.000	0.831	GATTGGCCAAAATCCATTTCATC	TTTGGGCACACAGTATCC

Table 2. Continued.

Gene and GenBank Accession Number	Primer Name	Efficiency (%)	R ²	Primer Forward (5' → 3')	Primer Reverse (5' → 3')
RPS18: MT332176	AgI_RPS18_a AgI_RPS18_b	1.960 1.868	0.934 0.924	TCTCAACTTACCTCTAGTACCC GGAGAATGTACCCGACGAAAGA	CACCAACAGTTCCTCCTCTAC GGGTACTAGAGGTAAGTTGAGAG
Syntaxin 1: MT332177	AgI_Syntaxin1	1.978	0.933	GAAATAACGGGGAAGAACAACACTAC	TGCCTGGCTTCAATATCAG
TATA-box: MT332168	AgI_TATAbox_a AgI_TATAbox_b	1.859 1.872	0.936 0.918	TGGCCAGTTTAGCAGTTATG CTCACTCATGGCCAGTTTAG	GCACCTGTCAGTACAACCTTT TACTTTGGCACCTGTCAGTA
V-ATPaseA: MT332179	AgI_V-ATPaseA	1.892	0.791	CTACGAAATAATCTGGGCTGTT	ACTCCTTATTCAAGGGATTTCAT

* All primer-pairs were used at 0.1 μM and were annealed and extended at 60°C for 60 s. Amplicon length varied from 80 to 200 bp. AgI, *Aphis glycines*; 60S, ribosomal protein 60S; AChE, acetylcholinesterase; AK, arginine kinase; EF, elongation factor; GAPDH3, glyceraldehyde-3-phosphate hydrogenase; HSP, heat shock protein; RPL, ribosomal protein L; RM, ribosomal mitochondrial protein; RNAPol2, RNA polymerase II; RPS, ribosomal protein S; V-ATPaseA, vacuolar ATPase; R², coefficient of determination.

† Genes ($n = 7$) with expression analyzed in the third screening phase by RT-qPCR (validation).

Two exon–exon junction primer-pairs were designed for almost all of them, totaling 58 primer-pairs, using IDT's PrimerQuest® Tool 2012 (<https://www.idtdna.com/pages/tools/primerquest>) with the parameters: melting temperature 58°C (minimum), 60°C (ideal), and 63°C (maximum); GC content 35% (minimum), 48% (ideal), and 50% (maximum); primer length 18 bp (minimum), 22 bp (ideal), and 25 bp (maximum); amplicon length 80 bp (minimum), 130 bp (ideal), and 200 bp (maximum); and to target exon–exon junctions (3'–5'). The GenBank accession numbers of the 32 *A. glycines* nucleotide sequences and the 58 primer-pair sequences are presented in Table 2.

RNA extraction and cDNA synthesis. Single apterous adult aphids were individually transferred to 2.0-ml screw-cap tubes containing two 5-mm borosilicate beads and 100 μ l of RNeasy Lysis Buffer (RNeasy Mini Kit Qiagen, Venlo, Netherlands). Aphids were homogenized at 4 m/s for 20 s in a FastPrep-24™ homogenizer (MP Biomedicals, Irvine, CA). Total RNA was extracted using the RNeasy Mini Kit according to the manufacturer instructions. The RNA yield was measured using Qubit™ RNA HS Assay Kit and Qubit™ 3 Fluorometer (Thermo Fisher Scientific, Waltham, MA). Twenty nanograms of RNA from each sample was used to synthesize first-strand cDNA using SuperScript® IV RT (Invitrogen–ThermoScientific, Waltham, MA), according to the manufacturer instructions. A rough estimate of the cDNA obtained per sample was performed in a NanoDrop 2000 spectrometer (Thermo Fisher Scientific) to normalize the amount of cDNA across samples. A single 20-fold dilution was performed for each cDNA sample with nuclease-free water for the RT-qPCR analysis.

RT-qPCR. The RT-qPCR was performed in a LightCycler® 480 Instrument II (Roche, Basel, Switzerland) using Maxima SYBR Green/ROX qPCR (Thermo Fisher Scientific) and 384-well plates. Each sample had three technical replicates and each primer-pair had no template controls (NTCs). The RT-qPCR program for all the primers consisted of: one cycle of initial denaturation at 95°C for 10 min, followed by 45 cycles of two-step amplification process (denaturation at 95°C for 10 s, annealing and extension at 60°C for 60 s), and subsequent melting curve with temperature increase of 1°C/s starting at 40°C for 1 min and going to 95°C, then final cooling at 40°C for 10 s. We performed three-phase screening with RT-qPCR analysis. In the first screening, we used cDNA from the three biological replicates from the Hancock population to test primer-specificity and efficiency, as well as to check for the possibility of nonexpressing genes (nonfunctional copies or pseudogenes), for the 58 primer-pairs of the 32 candidate reference genes (Table 2). In the second screening, genes/primer-pairs retained from the first screening (Table 2) had expression tested in the three biological replicates from the nine *A. glycines* populations to select genes with more stable expression across replicates and populations. In the third screening, the most promising candidate reference genes from the second screening results were analyzed again as to validate the results of the second screening (Table 2).

Stability of gene expression. The raw fluorescence from each well was used to generate melting curves using the MBmca package (Nucleic Acid Melting Curve Analysis on Microbead Surfaces) (Rödiger et al. 2014) and the function diffQ to calculate the melting temperatures (T_m) from the first derivative (Rödiger et al. 2014). After verification of presence of single peaks and no amplification in the NTCs, we used LinRegPCR version 2014.5 (Ruijter et al. 2009) to analyze the RT-

qPCR raw fluorescence data and estimate $\text{Log}_{10}(N_0)$, which is equivalent to efficiency-corrected C_q (quantification cycle) for all samples. In the first screening, primers with no amplification, nonspecific primers with multiple peaks in the melting curve, and primers with low amplification efficiency were eliminated. In the second screening, primers that did not amplify any one of the biological replicates or averaged more than one nonamplifying technical replicate were disregarded, leaving 14 candidate reference genes for quantitative analysis. Missing values were imputed for subsequent analysis using multilevel multiple imputation (50 times) with the *jomo* package (Quartagno and Carpenter 2019) in R. For each imputation, we calculated five measures of gene stability and the Pearson correlation coefficient for all pair-wise gene expression levels across the populations and biological and technical replicates. The results from each imputation were averaged across the 50 imputations. To represent the clustering of candidate reference gene groups a principal components analysis (PCA) was performed (Pearson 1901) using the average correlation matrix. This reveals potential reference genes that provide complementary measures of stability and correlated genes that reinforce each other. Three of the stability measures were calculated from a generalization of the BestKeeper method (Pfaffl et al. 2004). The BestKeeper method uses the standard deviation of gene expression across samples to estimate stability, with the smallest standard deviation being the most stable. Our data were structured to be able to estimate variation among technical replicates, biological replicates (individual aphids), and populations. We estimated the standard deviation (SD) among technical replicates within aphids for each gene (pooled across aphids within a population), the SD among aphids (biological replicates) within a population for each gene (pooled across populations), and the SD among populations for each gene as three measures of stability. We also used NormFinder version 2015 (Andersen et al. 2004) to estimate the stability of expression for individual genes and for pairs of genes. We did not use geNorm (Vandesompele et al. 2002), because, as shown by Andersen et al. (2004) in their supplementary information, geNorm assumes independence of expression among candidate genes and selects the gene that is most similar to the other genes tested and, therefore, can give erroneous results. The five measures of stability were normalized by transforming each to standard normal deviates across the candidate genes. To determine the most stable genes, the five normalized measures were averaged and the genes with the lowest values were selected as the most stable genes. Finally, using the results from the PCA, we selected genes that were independently expressed to have multiple measures of the reference genes, as well as correlated genes (similar to BestKeeper) to reduce variation in expression associated with one gene.

Results

Pyrethroid susceptibility among soybean aphid populations. The soybean aphids from Biotype 1 (susceptible control), Sutherland, and Lamberton showed the highest mean mortalities (high susceptibility) of 1.00, 0.82, and 0.97, respectively (Fig. 1). Soybean aphids from Howard Lake and Hancock presented an intermediate susceptibility (0.60 and 0.45, respectively) and those from St. Paul,

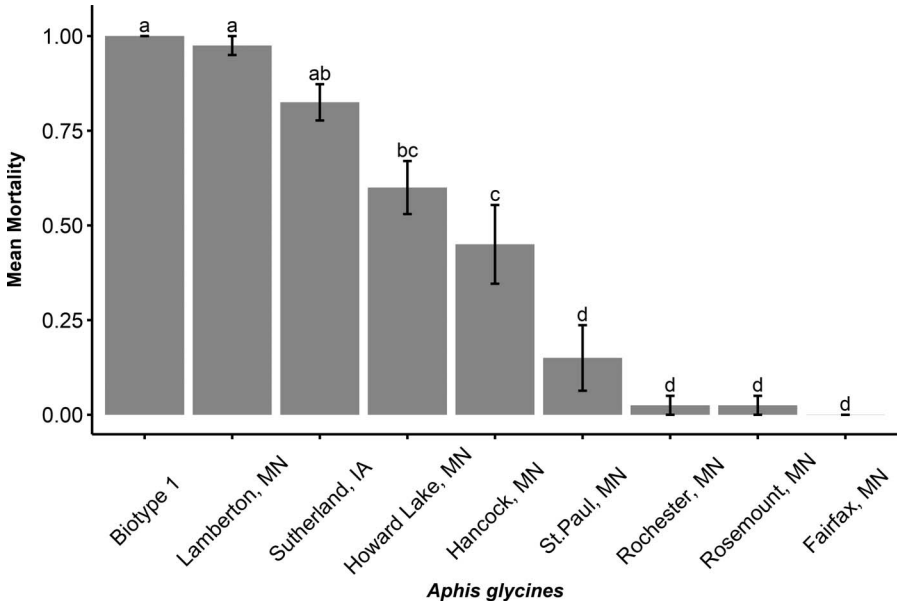


Fig. 1. Mean mortality of *Aphis glycines* in the LC₉₉ glass-vial pyrethroid (lambda-cyhalothrin) bioassay to estimate level of pyrethroid resistance. Different letters indicate significant differences in population mortality by Tukey's test ($P < 0.05$).

Rochester, Rosemount, and Fairfax were the least susceptible (0.15, 0.02, 0.02, and 0.00, respectively) (Fig. 1).

Amplification of the candidate reference genes (Screen 1). We chose the best primer-pair for each of the candidate reference genes based on the amplification efficiency showing a single peak in the melt curve analysis, and the R^2 of the regression to estimate C_q (Schmittgen and Livak 2008) in RT-qPCR. Across all 58 primer-pairs (from 32 candidate reference genes) assessed in the initial screening, amplification efficiency ranged from 0.000 to 2.071 and the R^2 of the regression to estimate C_q ranged from 0.499 to 1.000. A total of 30 primer-pairs for 30 sequences of the candidate reference genes were selected from the first RT-qPCR screening to proceed to the next screening (Table 2). The primer-pairs selected to advance to the second screening had amplification efficiencies ranging from 1.720 to 1.982 and R^2 ranging from 0.683 to 0.987. The candidate reference genes *helicase* and *RPL27* were eliminated in the first screening.

Expression stability (Screen 2). Out of the 30 sequences of the candidate reference genes analyzed in the second screening (Table 2), 16 were removed from consideration because they had at least one biological replicate with nonamplification or averaged more than one nonamplifying technical replicate. The remaining 14 candidate sequences, with an average 12.08% nonamplification of technical replicates, were statistically analyzed for stability (Fig. 2). The NormFinder single gene stability analysis indicated that β -actin, *AK* (arginine

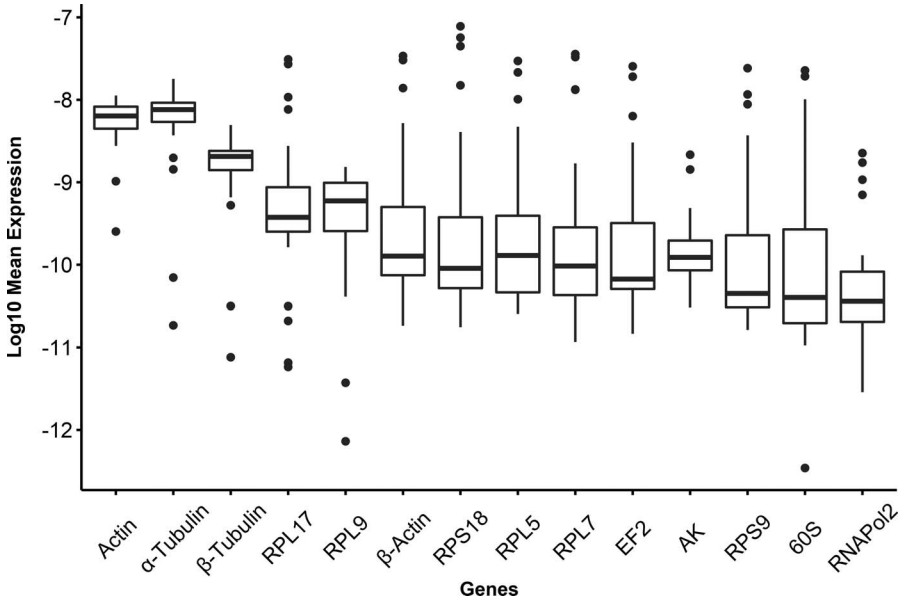


Fig. 2. Expression profile of the candidate reference genes ($\text{Log}_{10}(N_0)$) from *Aphis glycines* populations with different pyrethroid resistance levels. **60S**, ribosomal protein 60S; **AK**, arginine kinase; **EF**, elongation factor; **RPL**, ribosomal protein L; **RNAPol2**, RNA polymerase II; **RPS**, ribosomal protein S.

kinase), *RPL17* (ribosomal protein L17), *RNAPol2* (RNA polymerase II), and *RPL5* (ribosomal protein L5) had the highest stability (Fig. 3). Better stability (<0.25) was obtained with NormFinder paired gene stability analysis. Actin, *RPS18* (ribosomal protein S18), *RPL5*, β -actin, *AK*, *RPL9* (ribosomal mitochondrial protein L9), *RPL17*, and *RPS9* (ribosomal protein S9) contributed to the highest stability in gene pairs (Fig. 4). With BestKeeper, stable candidate reference genes exhibit a standard deviation <1 (Sundaram et al. 2019). The most stable candidate reference genes from the generalized BestKeeper analysis differed by source of variation (i.e., technical, biological, and between-population variation) (Fig. 5). In terms of technical variation, actin, *RPS18*, β -actin, *AK*, and *RPL5* were the most stable genes. In terms of biological variation (i.e., variation among aphids within populations), *AK*, actin, *RPL9*, *RNAPol2*, and *RPL17* were the most stable genes. In terms of variation among populations, actin, β -tubulin, α -tubulin, *RPL9*, and *AK* were the most stable genes. The average of the normalized values of the five stability measures (Table 3) indicated that *AK*, actin, β -actin, and *RPL9* were the most stable genes. In addition, *RNAPol2*, *RPL5*, and *RPL17* were more stable than the average candidate reference genes.

Two groups of genes were identified based on the PCA of the 14 sequences of the candidate reference genes (Fig. 6). The first PC axis (PC1) explained 88.68% of the variance in expression and the first two axes explained 94.05% of the variation.

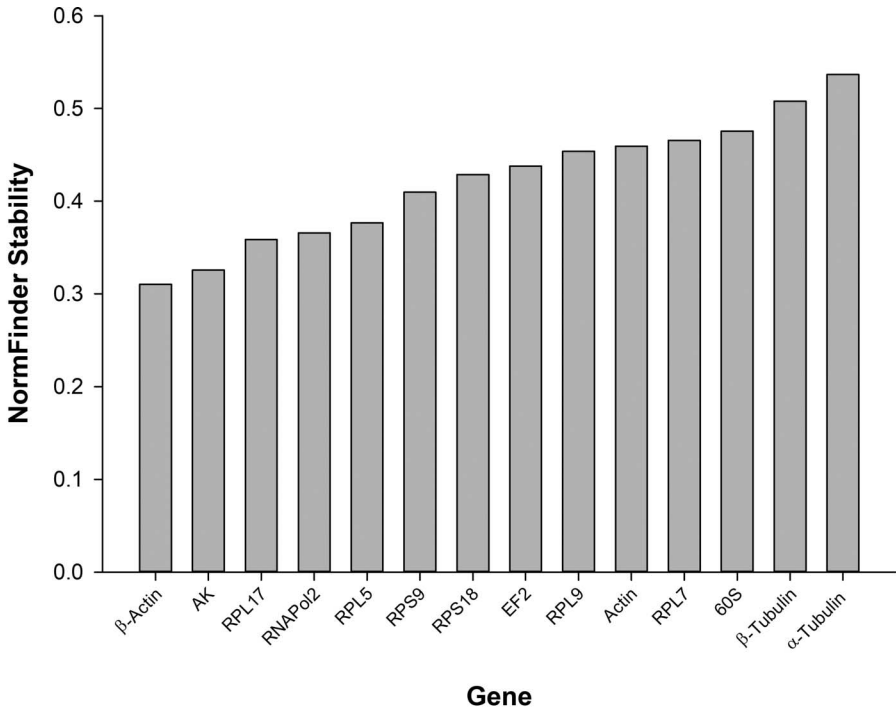


Fig. 3. Single gene expression stability according to NormFinder. The lower stability values indicate a more stable expression. 60S, ribosomal protein 60S subunit; AK, arginine kinase; EF, elongation factor; RPL, ribosomal protein L; RNAPol2, RNA polymerase II; RPS, ribosomal protein S.

PC1 separated the candidate reference genes into two groups. The first group of four genes was actin, β -tubulin, α -tubulin, and *RPL9*. Three of these, actin, β -tubulin, and α -tubulin, were highly correlated with each other (0.70–0.85), and *RPL9* was less correlated with them (0.67–0.71). These four genes were not highly correlated with the genes in the second group (0.004–0.60). Of these four genes, actin and *RPL9* had the highest expression stability (Table 3) and were selected for third level of screening (i.e., validation analysis). The other two genes, α -tubulin and β -tubulin, had poor stability and were disregarded from further consideration as a reference gene.

The second group comprised 10 highly correlated candidate reference genes. The six genes forming the core of this group, *RPS18*, *RPS9*, β -actin, *RPL5*, *RPL7*, and *60S*, were highly correlated (0.50–0.60) with stabilities ranging from 0.79 to 0.97. Of these, β -actin was the most stable (Table 3) and was retained for validation. *RPS9* and *60S* were the most unrelated to other candidates in this core group (Table 4), and as *RPS9* had higher stability than *60S*, it was retained for validation. The remaining four genes in this group were less correlated with the core group (0.52–0.82), and therefore could provide partially complementary information

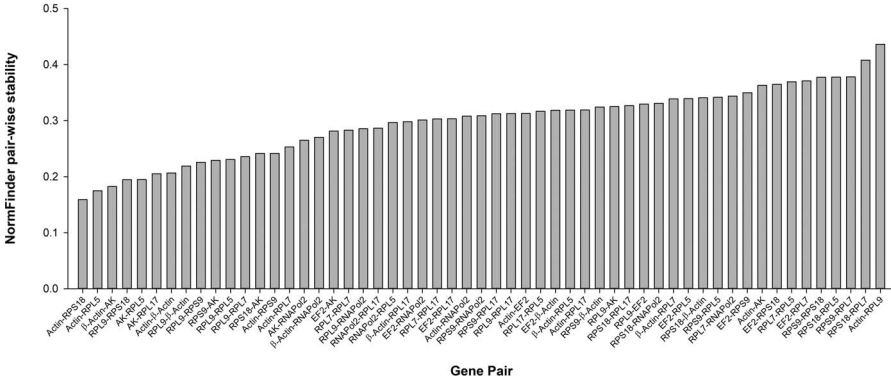


Fig. 4. Gene pair expression stability according to NormFinder. Gene pairs with poor stability are not shown. AK, arginine kinase; EF, elongation factor; RPL, ribosomal protein L; RM, ribosomal mitochondrial protein; RNAPol2, RNA polymerase II; RPS, ribosomal protein S.

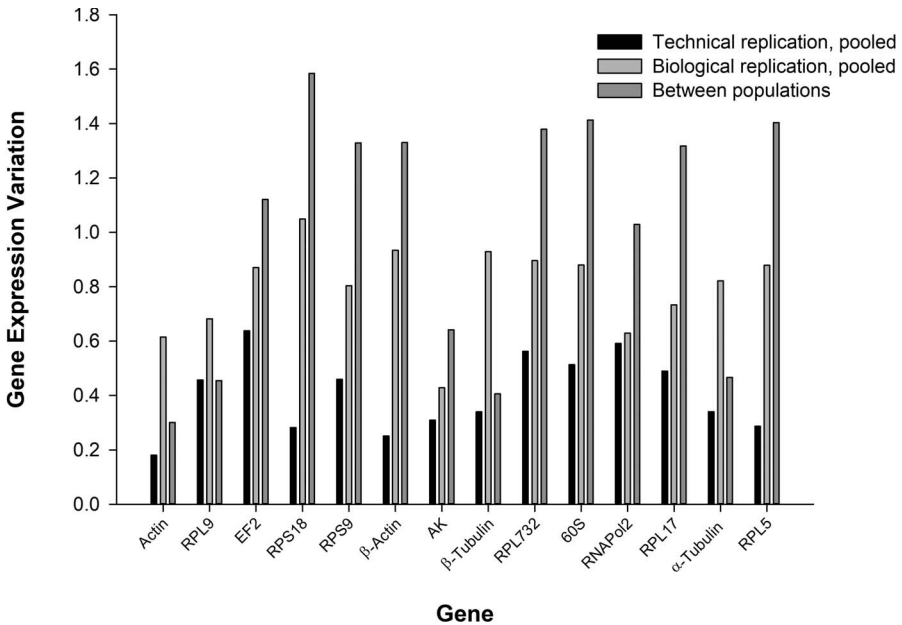


Fig. 5. Estimated standard deviations for gene expression variation in technical and biological replicates and among *Aphis glycines* populations with different pyrethroid resistance levels. 60S, ribosomal protein 60S subunit; AK, arginine kinase; EF, elongation factor; RPL, ribosomal protein L; RNAPol2, RNA polymerase II; RPS, ribosomal protein small subunit.

Table 3. Standard normal deviates for measures of stability of expression of candidate reference genes for expression analysis of detoxification genes in 27 apterous adults of *Aphis glycines* from populations with different pyrethroid susceptibility.*

Gene	Actin	RPL9	EF2	RPS18	RPS9	β -Actin	AK	β -Tubulin	RPL7	60S	RNAPol2	RPL17	α -Tubulin	RPL5
NormFinder single	0.55	0.47	0.23	0.09	-0.19	-1.66	-1.43	1.27	0.64	0.79	-0.84	-0.94	1.70	-0.68
NormFinder pairs	-1.07	-1.00	0.73	0.19	0.07	-0.91	-1.81	1.32	0.78	1.32	-0.26	-0.31	1.32	-0.40
Technical replicate, pooled	-1.61	0.35	1.63	-0.89	0.37	-1.11	-0.70	-0.47	1.10	0.75	1.31	0.58	-0.47	-0.85
Biological replicate, pooled	-1.12	-0.71	0.45	1.55	0.05	0.84	-2.26	0.81	0.61	0.51	-1.03	-0.39	0.16	0.51
Among populations	-1.56	-1.22	0.24	1.25	0.69	0.70	-0.81	-1.33	0.80	0.88	0.04	0.67	-1.20	0.86
Average	-0.96	-0.42	0.66	0.44	0.20	-0.43	-1.40	0.32	0.79	0.85	-0.16	-0.08	0.30	-0.11

* Negative values are better than the average and the smallest negative values are best. 60S, ribosomal protein 60S subunit; AK, arginine kinase; EF, elongation factor; RPL, ribosomal protein L; RNAPol2, RNA polymerase II; RPS, ribosomal protein S. The numbers indicated in bold indicate the averaged most stable genes.

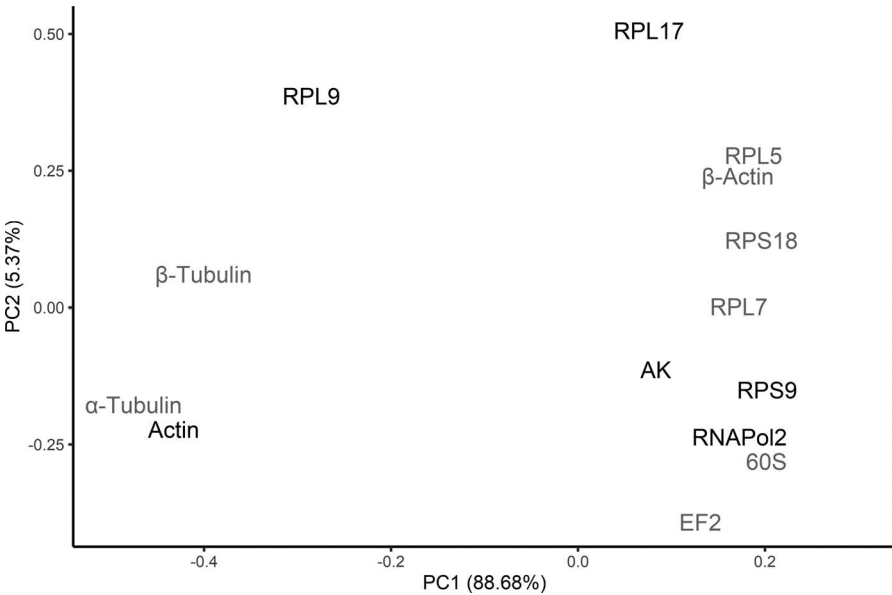


Fig. 6. Principal components analysis of the correlations between the expression of the candidate reference genes. The validated reference genes for pyrethroid resistance analysis were actin, *RPL9*, *RPS9*, *RPL17*, *AK*, and *RNAPol2* and are represented in black. The genes in gray were not selected.

Table 4. Pearson correlation coefficients between candidate reference genes of the second core group of the second screening for expression level analysis of detoxification genes in 27 apterous adults of *Aphis glycines* from populations with different pyrethroid susceptibility that could provide independent or complementary information.*

Candidate	Gene Comparison						Average
	Actin	α -Tubulin	RPL9	AK	RNAPol2	RPL17	
RPS18	0.2373	0.2043	0.3677	0.6783	0.8231	0.7869	0.5754
RPS9	0.1234	0.0585	0.2759	0.6549	0.7755	0.7288	0.5052
β -Actin	0.3062	0.2606	0.4370	0.6576	0.7817	0.8134	0.5946
RPL5	0.2144	0.1979	0.4377	0.7184	0.8208	0.8237	0.6013
RPL7	0.1503	0.1402	0.3455	0.7555	0.7703	0.7244	0.5482
60S	0.1172	0.0081	0.2737	0.6676	0.8297	0.6769	0.5021

* AK, arginine kinase; RPL, ribosomal protein L; RNAPol2, RNA polymerase II. The values in bold indicate the averaged correlation coefficients.

Table 5. Standard normal deviates for measures of stability of expression of candidate reference genes of detoxification genes in 27 apterous adults of *Aphis glycines* from populations with different pyrethroid susceptibility.*

Method	Actin	RPL9	RPS9	β -Actin	AK	RNAPol2	RPL17
NormFinder single	-1.20	-1.58	0.44	0.57	0.38	0.01	0.17
NormFinder pairs	-0.78	-0.76	0.24	0.53	0.16	0.41	0.18
Technical replicate, pooled	-2.06	-2.45	-0.57	1.47	0.17	1.67	-0.39
Biological replicate, pooled	-1.85	-1.73	-0.52	-0.56	-1.20	-0.68	-1.69
Among populations	-1.50	-1.35	0.68	-0.96	-0.13	0.18	1.26
Average	-1.48	-1.57	0.06	0.21	-0.12	0.32	-0.09

* Negative values are better than the average and smaller negative values are better. AK, arginine kinase; RPL, ribosomal protein L; RNAPol2, RNA polymerase II; RPS, ribosomal protein S. The values in bold indicate the averaged standard normal deviates per gene.

to the core. *RNAPol2* and *RPL17* had the highest stability and were selected for validation. *AK* was weakly associated with the core group (0.52–0.76) and was retained because it might provide the most complementary information to the core. These four genes could provide complementary information to the core group and to each other.

In summary, the second screening of candidate reference genes resulted in seven genes for validation: actin, β -actin, *RPL9*, *RPS9*, *AK*, *RNAPol2*, and *RPL17*. These genes were distributed throughout the PCA space, as would be expected for complementary gene expression.

Validation of the selected candidate reference genes (Screen 3). In the third level of screening, β -actin had >50% of wells without amplification and, therefore, this gene was disregarded as a reference gene. The candidate reference genes actin, *RPL9*, and *RPS9* had better stability characteristics than in the second screening; however, *AK* and *RNAPol2* had poorer stability, and *RPL17* had similar stability (Tables 3, 5). Correlation analysis at this level of screening showed that actin and *RPL9* were highly correlated, but they were only moderately correlated in the second level of screening. The other genes were not highly correlated, and most were less correlated than in the previous screening, indicating that they may provide complementary expression.

Even though there were differences in the collection methods and in the level of resistance of the *A. glycines* populations (different phenotypes), we found good stability in the gene expression of the candidate reference genes (Table 6). Finally, after the third level of screening, six genes (actin, *RPL9*, *RPS9*, *AK*, *RNAPol2*, and *RPL17*) were validated as suitable candidate reference genes for gene expression analysis in different *A. glycines* populations with contrasting levels of pyrethroid resistance.

Table 6. Gene pairs with best expression stability (NormFinder) for expression analysis of detoxification genes in apterous adults of *Aphis glycines* in pyrethroid resistance studies.*

Gene1	Gene2	Stability	
		Mean	SD
RPL9	RNAPol2	0.220	0.014
Actin	RPL17	0.225	0.018
RPL9	RPS9	0.234	0.017
Actin	RNAPol2	0.237	0.016
Actin	RPS9	0.240	0.018
RPL9	RPL17	0.248	0.016

* SD, standard deviation; RPL, ribosomal protein L; RNAPol2, RNA polymerase II; RPS, ribosomal protein S.

Discussion

The accuracy of the RT-qPCR data analysis depends on an adequate selection of reference genes (Everaert et al. 2011). It has been found that for trustworthy results more than one reference gene should be used in an experiment because together they improve stability among samples (Radonić et al. 2004, Vandesompele et al. 2002). Reference genes that are highly but not perfectly correlated provide measures of the same or similar biological process. Having multiple highly correlated reference genes would reduce the influence of methodological and other sources of technical variation but would not reduce variation associated with biological replication or among populations. To reduce error associated with these sources of variation, the expression profiles of the candidate genes should not be highly correlated. Reference genes that are not highly correlated provide complementary information and will reduce the influence of variation in reference gene expression across biological replicates and populations. Our introduction of the correlation matrix and PCA for the selection of appropriate reference genes provides a statistical method for identifying complementary reference genes. This allowed us to select reference genes that were individually stable and complementary.

It is also important to evaluate gene expression stability across populations or treatments (Lu et al. 2013, Mamidala et al. 2011, Zhai et al. 2014). Both NormFinder and BestKeeper, two of the most commonly used programs for identifying best reference genes, do not clearly address this issue, because they only consider stability for a single source of variation. Our data were highly structured, which allowed us to partition the observed variation in expression and estimate stability for three sources of variation, technical variation, biological replication, and among populations. This allowed us to generalize BestKeeper and required the best reference genes to be stable for all three sources of variation.

Adequate reference genes have been identified in many insect species (Bansal et al. 2012, Chang et al. 2017, Cristiano et al. 2016, Lu et al. 2013, Ma et al. 2016, Mamidala et al. 2011, Paim et al. 2012, Rodrigues et al. 2014, Van Hiel et al. 2009, Yang et al. 2014a, Zhai et al. 2014). For our work, nine aphids and one psyllid (*A. craccivora*, *A. glycines*, *A. gossypii*, *Diaphorina citri*, *Diuraphis noxia*, *L. erysimi*, *Megoura viciae*, *Myzus persicae*, *R. padi*, and *T. citricida* [*Aphis citricidus*]) served as the source of potential reference genes for *A. glycines* for analysis of detoxification gene expression. From our three-phase screening, the HKGs identified as suitable reference genes for pyrethroid resistance expression were actin, *RPL9*, *RPS9*, *RPL17*, *AK*, and *RNAPol2*. Of the 10 most frequently used reference genes in insects (i.e., Actin, *RPL*, Tubulin, *GAPDH*, *RPS*, *18S*, *EF1 α* , TATA, *HSP*, and *SDHA*) (Lü et al. 2018), our work includes three of these genes (Actin, *RPL*, and *RPS*). Other studies on aphid species also validated these three genes as robust reference genes as detailed below (Bansal et al. 2012, Kang et al. 2017, Korumutla et al. 2016, Sinha and Smith 2014).

Actin plays many roles in cell function (Perrin and Ervasti 2010) and was identified to have good expression stability in our study. Actin also showed good stability in other aphid species such as *Diuraphis noxia* under exposure to host plant resistance (Sinha and Smith 2014), *R. padi* with viral infection (Wu et al. 2014), and *Myzus persicae* across different tissues, wing dimorphism, photoperiod, and temperature (Kang et al. 2017). Additionally, actin was validated in other insects under different experimental conditions such as in *Apis mellifera* L. subjected to bacterial infection (Scharlaken et al. 2008), *Drosophila melanogaster* Meigen under virus challenge, heat stress, and various diets (Ponton et al. 2011), *Anopheles sinensis* Wiedemann in different life stages, tissues, and levels of insecticide (neonicotinoid) resistance, and *Liriomyza trifolii* (Burgess) in different development stages and temperatures (Chang et al. 2017). Jiang et al. (2010) and Yang et al. (2014b) also found actin to be suitable as a reference gene for *Liposcelis bostrychophila* Badonnel under pyrethroid stress and immatures of *Locusta migratoria* (L.). However, actin was found to have low stability under different biotic and abiotic conditions in *Drosophila suzukii* (Matsumura) (Zhai et al. 2014), suggesting that even commonly used HKGs must be validated on a case-by-case basis.

Ribosomal proteins are involved in multiple processes in the genome (Plocik and Guthrie 2012), and translation is one of the most important (Hoffman et al. 1996). We found three ribosomal genes with good stability. The gene *RPL9* had the best stability across populations of *A. glycines* with varying levels of insecticide resistance. It has been reported as a good reference gene for different nymphal stages and tissues of other insects (An et al. 2016, He et al. 2014). The gene *RPS9* has been established as a suitable reference gene in *A. glycines* and *Diabrotica virgifera virgifera* LeConte subjected to host plant resistance and exposure to dsRNA (Bansal et al. 2012, Rodrigues et al. 2014). Our results demonstrate the stability of this gene across populations of *A. glycines* with a range of pyrethroid resistance. The gene *RPL17* was established as a good reference gene in our work. This gene also showed stable expression in *T. citricida* undergoing temperature variation (Ma et al. 2016) and *Myzus persicae* under different photoperiods, temperatures, and levels of insecticide susceptibility (Kang et al. 2017).

The enzyme *AK* catalyzes phosphorylation in cells (Zhou et al. 1998) and was stable in our experiment. Expression of this gene was found to be stable across different body tissues in *Bombus terrestris* (L.) (Horňáková et al. 2010); insecticide-induced stress in *Spodoptera litura* (Fabricius) (Lu et al. 2013); different populations, developmental stages, and tissue in *Drosophila suzukii* (Zhai et al. 2014).

The multiprotein *RNAPol2* transcribes DNA into mRNA (Hirose et al. 1999). *RNAPol2* showed the highest levels of stability across populations of *A. glycines* in our study. The expression of *RNAPol2* was also found to be stable under starvation and UV irradiation stress treatments in other insects (Shang et al. 2015).

Interestingly, some genes (e.g., *TBP*, *EF1 α* , *GAPDH*, β -Actin, and *RPS18*) that are widely used in studies related to pyrethroid resistance were among the least stable across our populations of *A. glycines* with different level of pyrethroid resistance. The genes *TBP* and *EF1 α* have been used as reference genes in various insect studies, including *Schistocerca gregaria* (Forsk.) (Van Hiel et al. 2009), *Drosophila melanogaster* (Ponton et al. 2011), *A. glycines* (Bansal et al. 2012), *Plutella xylostella* (L.) (Fu et al. 2013), *T. citricida* (Shang et al. 2015), and *A. gossypii* (Ma et al. 2016). In the aforementioned studies, *TBP* and *EF1 α* were found to be stable across different experimental conditions. Additionally, *EF1 α* was found to be stable between populations of *Bemisia tabaci* (Gennadius) varying in neonicotinoid resistance (Li et al. 2013) and between groups of *Ctenocephalides felis* (Bouché) exposed and not exposed to avermectin (McIntosh et al. 2016). However, we did not find that these genes were expressed consistently across *A. glycines* populations in this study. *GAPDH*, which is involved in energy production (Nicholls et al. 2012), is commonly used in insect species as a reference gene under disease stress, different tissues, temperature fluctuations, and insecticide exposure (avermectin) (Chang et al. 2017, Ma et al. 2016, McIntosh et al. 2016, Paim et al. 2012, Scharlaken et al. 2008, Van Hiel et al. 2009). However, *GAPDH* did not show adequate stability for *A. glycines* populations with different levels of pyrethroid resistance. The genes β -Actin and *RPS18* have been used several times as reference gene in insects, being mostly successful in *Rhodnius prolixus* Stål in experiments with different tissues (Paim et al. 2012), *T. citricida* under heat stress and across various life stages (Shang et al. 2015), *A. gossypii* undergoing different developmental studies, geographical distribution and feeding conditions for β -Actin, and temperature oscillation for *RPS18* (Ma et al. 2016), and *Tetranychus cinnabarinus* (Boisduval) strains with different levels of resistance to insecticides in different developmental stages for *RPS18* (Sun et al. 2010). Although at the initial screening stages of our study β -Actin and *RPS18* showed good stability characteristics when paired with other genes, their stability was not good by themselves. Then the stability of these two genes decreased in the second level of screening; therefore, they were not chosen to be final candidate reference genes. These results demonstrated that even commonly used reference genes need to be validated in specific species and experimental condition combinations.

This is the first study that sought to assess stability of candidate reference genes across *A. glycines* populations for examination of expression of detoxification genes related to pyrethroid resistance. To understand if differences in pyrethroid susceptibility are due to overexpression of detoxification genes in important agricultural pests, such as *A. glycines*, it is imperative to have adequate reference

genes to normalize the expression across populations. Furthermore, the work presented here brings three innovations to the process of mining the best reference genes for gene expression analysis. First, a three-phase screening process was used to identify potential genes based on expression and stability, and to validate the identified genes. Second, the commonly used software for selecting reference genes, BestKeeper, generalized to handle nested data structures and independently evaluate sources of variation in expression. Third, PCA was used to identify nonredundant genes. PCA provided an objective method to select a stable set of genes. The methods and results of this robust study should contribute to gene expression studies not only in *A. glycines*, but also to other aphid species.

Acknowledgments

We are grateful to Amelia Lindsey for providing a review of an earlier version of this paper, Lisa Behnken and Bruce Potter for helping to locate fields with soybean aphid infestations, and James Menger, Arthur Vieira, Mads Bartz, and Pheylan Anderson for assistance in the field and laboratory. This work was supported by the Minnesota Rapid Agricultural Response Program (RARF) and the USDA National Institute of Food & Agriculture (NIFA) (award no. 2019-68008-29892).

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