Multivariate Analysis and Selection Indices to Identify Superior Quince Cultivars for Cultivation in the Tropics

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Abstract. Among the fruit species cultivated in subtropical climates, quince has productive cultivars with high horticultural potential. The objectives of this study were to evaluate the genetic divergence among quince cultivars through multivariate procedures and to identify cultivars for cultivation in the tropics through selection indices. Twenty-seven productive quince cultivars were grown in a location with a high-altitude tropical climate. The number of fruit, estimated yield, flowering period, number of buds, number of shoots, number of brindles per shoot, shoot length, average fruit weight, fruit length, and fruit diameter were measured. A multivariate principal component analysis (PCA) associated with the unweighted pair group method with arithmetic means (UPGMA) based on Gower distance and Pearson correlation coefficients was used to evaluate genetic divergence. Superior cultivars were defined by the selection index based on the rank summation index and the Z-index. UPGMA grouping indicated there was genetic variability among cultivars and showed that groups that were more dissimilar [e.g., the cultivars Bereckzy and Champion (distance = 0.69)] had the potential to be used in future stages of quince selection. The estimated yield, shoot length, fruit weight and diameter, and flowering period contributed to the maximum variability among quince cultivars. The selection indices identified cvs. Bereckzy, Alaranjado, and Alongado (30, 68, and 73 rank summation index, respectively) as superior, simultaneously considering the evaluated traits with greater potential for cultivation in the tropics.

The quince tree (Cydonia oblonga Miller) belongs to the genus Cydonia and originates from temperate regions (Rigitano, 1957). The world production of quinces is 596,532 t; Turkey leads world production with 135,500 t, followed by China, Iran, Argentina, Azerbaijan, and Spain (FAO, 2017).

Horticulture plants—in particular, minor ones, including quince—have been recognized for their human health benefits. They have high contents of non-nutritive, nutritive, and bioactive compounds (Alp et al., 2016; Dogan et al., 2014; Ercisli et al., 2003). For these reasons, quince fruit are used mainly for the processing of jam and jelly or they may be peeled, then roasted, baked, or stewed (Fattouch et al., 2007; Hamauzu et al., 2006; Silva et al., 2004).

Some cultivars have commercial potential that is still unexploited, especially in Brazil; however, quince production has been resumed in subtropical climates (IBGE, 2017). The fruit from most quince cultivars are firm, acidic, and astringent; however, when they are ripe, the fruit have a nice flavor and are used for industrial processing (Leonel et al., 2016). In subtropical regions, the low supply of raw quince material and its consequent valorization has been noticed by canneries that have imported the raw material from Argentina as pulp (Dall’Orto et al., 2007). Despite this positive scenario of quince production in subtropical regions, only the Portugal cultivar is used in canneries (Seifert et al., 2009).

There are few studies on the agronomic performance of quince cultivars cultivated in the tropics, especially in humid subtropical climates, which hinders the selection of cultivars with superior agronomic characteristics and the use of this fruit in regions with a mild climate. In addition, regarding cultivated crops in the tropics, it is possible to harvest fruit trees that originated from areas with temperate climates during low-supply seasons (Barbosa et al., 2010; Chagas et al., 2012). This phenomenon occurs because fruit can be harvested earlier in warmer regions than in colder regions (Souza et al., 2013). This early maturity is a result of the warmer winter, which allows pruning and sprouting to occur in winter because there is no risk of late frost (Bettiol Neto et al., 2011).

Previous studies showed that quince cultivars have high genetic variability (Kafkas et al., 2015; Orhan et al., 2014); hence, the characterization of productive cultivars with high horticultural potential for cultivation in the tropics is crucial to maintain productivity (Manica-Berto et al., 2013). In addition, the selection of cultivars should not be based on a single factor, because cultivars with economic potential have multiple traits of agronomic interest, such as traits related to productive performance, adaptability, and stability in production (Bertini et al., 2010).

To advance the selection of cultivars, tools based on multivariate analyses have become essential in developing studies for plant breeding programs. According to Cruz et al. (2004), comparing results from several multivariate analysis techniques provides a more accurate interpretation of the differences among cultivars, affording a more accurate interpretation of results with a low demand for resources and work in breeding programs.

Another tool widely used in cultivar selection is the multiple-trait selection index, which allows more productive and adapted cultivars to be obtained through combining several attributes. The rank summation index proposed by Mulamba and Mock (1978), as a nonparametric index, has the advantage of not requiring economic weights or the estimated parameters besides averages. In general, the rank summation index is based on genotype ranking in relation to the desired trait and, subsequently, the sum of the ranks of several traits simultaneously (Cruz et al., 2004; Teixeira et al., 2012). Moreover, the selection index based on the sum of standardized variables, or Z-index, is an alternative to other indices. It does not require estimates of genetic and phenotypic covariance and it allows the traits that have favorable effects on the cultivar to be visualized (Franca et al., 2016).

Thus, the aim of this study was to evaluate the genetic divergence among quince cultivars through multivariate procedures and to identify superior cultivars for cultivation in the tropics through selection indices.
Material and Methods

The experiment was conducted at an experimental orchard south of Minas Gerais State, the municipality of Lavras, Brazil. The Köppen climate classification of the study region is Cwa (lat. 21°14’S, long. 45°00’W; average altitude, 918 m), which indicates a high-altitude tropical climate with cold and dry winters and warm and moist summers (Alvares et al., 2013).

Plants were propagated by grafting using Chaenomeles sinensis ‘Japonês’ as the rootstock. Twenty-seven quince cultivars belonging to the species Cydonia oblonga, were studied: Alaranjado, Alongado, Apple, Bereckzy, Champion, Cheldow, Constantinopla, CTS, Dangers, De Patras, De Vranja, Dulot, Fuller, Kikami, Lajeado, Meech Proli fic, Meliforme, Mendoza Inta-37, Pera, Pineapple, Portugal, Provence, Radaelli, Reas Mamouth, Smyrna, Van Deman, and Zuquerineta.

The plantation was established in 2010, and the experimental plots consisted of six plants per cultivar, with 2.5-m spacing between plants and 4.0-m spacing between rows. Pruning was completed at beginning of June throughout the three productive cycles evaluated (2013–16). In pruning, excess branches were removed from the inner portion of the canopy. The branches facing the canopy end were reduced by up to 25 cm. Fifteen days after pruning, hydrogen cyanamide (HC) (Dormex®, 49% HC, SKW, Trostberg, Germany) was applied at 0.5%.

The plot was composed of two plants in which eight branches were marked, totaling 16 branches per cultivar. For the evaluations were selected branches of the previous year measuring, on average, between 10 and 35 cm. Fifteen days after pruning, evaluations began. During the first stage, the count of buds per branch, number of shoots per branch, and number of brindles (floriferous branches) per marked branch was performed.

Aiming to identify superior cultivars with important characteristics for quince breeding, the number of fruit, estimated yield (measured in kilograms per hectare), flowering period (measured in days), number of buds, number of shoots, number of brindles per shoot, shoot length (measured in centimeter), average fruit weight (measured in grams), fruit length (measured in millimeters), and fruit diameter (measured in millimeters) were evaluated. Phenology-related characteristics were measured monthly, beginning at shoot emergence after pruning in June 2013. Shoot growth was monitored by measuring the length and number of existing nodes and shoot diameter at the end of production.

The production evaluation was performed by counting the total number of fruit per plant, resulting in the number of fruit produced throughout the quince production season. Plant yield was determined by multiplying the total number of harvested fruit by the total weight of the fruit from each harvest, and the estimated yield was calculated by multiplying the production value per plant by the density of plants per hectare (1,000 plants). Ten fruit were selected randomly per cultivar, and their length, diameter, and average weight were measured.

Gower distance and principal component analysis (PCA) were used to quantify the genetic diversity among cultivars. Fruit production, phenology and physical characteristics were measured.

Fig. 1. Dendrogram of genetic dissimilarity among quince cultivars based on a Gower distance matrix and unweighted pair group method with arithmetic means clustering.

Table 1. Principal component (PC) analysis showing the eigenvalues, proportions, and cumulative proportions of the quantitative traits from different quince cultivars in the tropics.

| Variables                  | PC 1   | PC 2   | PC 3   | PC 4   | PC 5   | PC 6   | PC 7   |
|----------------------------|--------|--------|--------|--------|--------|--------|--------|
| No. of fruit               | 0.359  | 0.191  | 0.432  | -0.382 | 0.249  | 0.118  | 0.118  |
| Estimated productivity (kg·ha⁻¹) | 0.438  | -0.036 | 0.265  | 0.348  | 0.279  | 0.024  | -0.005 |
| Flowering duration (d)     | 0.038  | -0.210 | 0.701  | 0.397  | -0.244 | -0.480 | 0.005  |
| No. of buds                | 0.316  | 0.401  | -0.135 | 0.092  | -0.130 | -0.377 | -0.341 |
| No. of shoots              | 0.259  | 0.345  | 0.062  | -0.020 | -0.767 | 0.378  | 0.193  |
| No. of brindles            | 0.201  | 0.316  | 0.056  | 0.731  | 0.415  | 0.371  | 0.054  |
| Shoot length (cm)          | 0.390  | 0.174  | -0.365 | 0.010  | 0.045  | -0.427 | -0.149 |
| Average fruit weight (g)   | 0.302  | -0.468 | -0.141 | 0.076  | -0.070 | 0.137  | -0.274 |
| Fruit length (mm)          | 0.357  | -0.318 | -0.272 | 0.128  | -0.009 | -0.177 | 0.761  |
| Fruit diameter (mm)        | 0.317  | -0.434 | -0.001 | 0.098  | -0.123 | 0.317  | -0.393 |
| Eigenvector                | 3.95   | 2.61   | 1.23   | 0.76   | 0.57   | 0.53   | 0.18   |
| Total variation (%)        | 39.53  | 26.06  | 12.25  | 7.56   | 5.65   | 5.32   | 1.83   |
| Accumulated total variation (%) | 39.53  | 65.59  | 77.84  | 85.40  | 91.05  | 96.37  | 98.20  |
were used for these analyses. Cruz et al. (2004) recommend the use of multivariate evaluations of cultivars from germplasm banks because replicates are not always available, making it difficult to quantify the environmental influences on individuals. Based on a dissimilarity matrix (27 × 27), the agglomerative clustering method of the average linkage among groups (UPGMA) was applied to establish groups of cultivars. The efficiency of the hierarchical clustering method was tested based on cophenetic correlation coefficients (CCCs) estimated according to the methodology described by Sokal and Rohlf (1962). The cutoff point of the dendrogram formed by the UPGMA method was defined according to Mojena (1977).

The identification of superior genotypes from the simultaneous selection of the 10 evaluated traits was performed based on the rank summation index and the index of the sum of the standardized variables, or Z-index. The rank summation index consists of sorting favorable cultivars according to the classes of each evaluated trait. After this classification, the diverse traits for each cultivar were summed and formed the index proposed by Mulamba and Mock (1978). The index model is as follows: \( I_j = \sum_i y_{ij} \), where \( I_j \) is the index for cultivar \( j \) and \( n_{ij} \) is the classification number of characteristic \( i \) for cultivar \( j \). The Z-index is calculated from the standardized variables and allows the performance of each cultivar for all traits to be visualized. This index is based on standardized variables \( (Z_{ij}) \) with the objective of making them directly comparable by the calculation \( Z_{ij} = (y_{ij} - \bar{y} \times jk)/s_{jk} \). This way, \( Z_{ij} \) is the value of standardized variable \( k \) corresponding to characteristic \( k \) of population \( i \) in repetition \( j \); \( y_{ij} \) is the observation of characteristic \( k \) in population \( i \) in repetition \( j \); \( \bar{y} \times jk \) is the general average of characteristic \( k \) in repetition \( j \); and \( S_{jk} \) is the phenotypic SD of characteristic \( k \) in repetition \( j \). Because the variable \( Z \) can assume both negative and positive values, the number three was added to the values to make them positive. In this case, the population average, instead of zero, assumed the value three. After standardization of the variables, the sum of the Z-values was obtained: \( Z_{ij} = Z_{ij1} + Z_{ij2} + \ldots + Z_{ijn} \). To verify the similarities of the selections identified through each index, the coincidence percentage of the selection was estimated.

Multivariate analyses were performed using Genes software (Cruz, 2013), and Excel software was used for the rank summation index and to obtain the Z-index.

**Results and Discussion**

The clustering analysis based on Gower distance and clusters by UPGMA had a CCC of 0.80 and formed three groups (Fig. 1), using the cutoff line suggested by Mojena (1977). The maximum distance (\( d_{ii} \)) was obtained between cultivars Bereckzy and Champion (\( d_{ii} = 0.69 \)); the minimum distance was between cultivars Dulot and Radaelli (\( d_{ii} = 0.07 \)). The maximum genetic distance indicates the most divergent cultivars; the minimum distance, the most similar cultivars. Cultivars Bereckzy and Champion were more divergent than other cultivar pairs as a result of their large differences in number of fruit, yield, flowering duration, numbers of buds and brindles, shoot length, and fruit weight. However, cultivars Dulot and Radaelli were more similar than other cultivar pairs because their evaluated characteristics were very similar.

Group 1 was composed of cultivars Alaranjado and Bereckzy, accounting for 7.4% of the total quince cultivars. This group, on average, had predominately the greatest values for all analyzed characteristics, except for flowering days and fruit weight. Group 2 (40.7%) was formed by cultivars Dulot, Radaelli, Meliforme, Pineapple, Van Deman, Mendoza Inta 37, Constantinopla, Meech Prolific, Lajeado, Alongado, and Fuller. This group was characterized by having heavier fruit (223.3 g) and a longer flowering period (46.7 d) than cultivars in other groups. Group III (51.9%) consisted of cultivars Champion, Zuquerinetia, De Vranja, Kiakami, Smyrna, Apple, Pera, CTS, De Patras, Dangers, and 1326 HORT SCIENCE VOL. 54(8) AUGUST 2019

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*Significant at 1% and 5% probability by t test, respectively.

NF = number of fruit; Y = estimated yield; DF = duration of flowering; NB = number of buds; NS = number of shoots; BL = shoot length; AFW = average fruit weight; FD = fruit diameter.
In the dispersion analysis, the first three components explained 77.8% of the total accumulated variance. The first component (PC1) accounted for 39.53%; the second (PC2), 26.06%; and third (PC3), 12.25% (Table 1). The characteristics that contribute most to the components are those with greater eigenvalues in the main components. In contrast, the lower contributions are from those with greater eigenvectors in fewer components (Cruz et al., 2004).

The results presented in Figs. 1 and 2 show the similarities in the distribution of the formed groups according to the cultivars shown in the dendrogram and through graphical analysis using the PCs. According to Cruz et al. (2004), UPGMA clustering allows more similar cultivars within groups to be identified than other multivariate methods. Despite the diversity found among quince cultivars, only superior cultivars are significant in relation to the most important characteristics and mainly have high yields. The diversity results indicate the genetic variability between the formed groups, and this information can contribute to and guide future research strategies. The use of this variability may occur through the selection of cultivars from groups 1 and 2, with greater averages for the main agronomic and phenologic characteristics of interest, such as number of fruit, estimated yield, duration of flowering, number of buds, number of shoots, number of brindles per shoot, shoot length, average weight of fruit, and length of peach fruit. This strong correlation indicates that environmental factors, such as the nutritional regime, may play a significant role in fruit size and quality. Thus, for the indirect selection of quince cultivars with good shoot development, it is necessary to select cultivars with high physical fruit characteristics, thus obtaining greater yields.

With the aim of identifying the most divergent cultivars that also have the greatest averages in relation to the selection traits, a ranking of variables considered important in quince crops was performed, enabling the selection of superior cultivars. The results of the ranking are presented in Table 3. According to the criteria established for the characteristics, the rank summation index varied from 30 to 224 for the cultivars Bereckzy and Champion. A lesser value indicates a more similar cultivars within groups to be identified than other multivariate methods.
expected that these cultivars form populations with a high probability of obtaining clones with high potentials for agronomic characteristics.

In the comparison between Z-indexes and rank summation index, 100% coincidence was verified among the selected quince cultivars. According to Vieira et al. (2017), the greater the coincidence coefficient between two selection indices, the greater the similarity of the selection results between them.

Figure 3 shows the graphs of the cultivars that had the best and the worst performance, on average, for the 10 evaluated traits according to the Z-index. It is noteworthy that 'Bereckzy', 'Alaranjado', and 'Alongado' had a greater or similar performance than that calculated by the average of the 10 evaluated traits; hence, they were identified as having the best performance. This result demonstrates the possibilities of quince diversification with the selected cultivars. Cultivars Zuquerineta, De Vranja, and Champion had lower than average performance and the lowest performance among the 27 evaluated for all traits.

**Conclusions**

The UPGMA groups indicated there was genetic variability among cultivars and showed that groups with more dissimilar cultivars had the potential to be used in future stages of quince selection. In our study, it was shown that productivity parameters, including shoot length, fruit weight and diameter, and flowering period, contributed to the maximum variability among quince cultivars. Regarding the simultaneous evaluation of all traits, the use of selection indices allowed the superior cultivars Bereckzy, Alaranjado, and Alongado to be identified.

**Literature Cited**

Alp, S., S. Ercisli, H. Dogan, E. Temim, A. Leto, M. Zia-Ul-Haq, A. Hadziabulic, and H. Aladag. 2016. Chemical composition and antioxidant activity *Ziziphus clinopodioides* ecotypes from Turkey. Rom. Biotechnol. Lett. 21:11298–11303.

Alvares, C.A., J.L. Stape, P.C. Sentelhas, J.L.M. Gonçalves, and G. Sparovek. 2013. Köppen’s climate classification map for Brazil. Meteorol. Zeitschrift 22:711–728.

Barbosa, W., E.A. Chagas, C.V. Pommer, and R. Pio. 2010. Advances in low-chilling peach breeding at Instituto Agronômico, São Paulo State, Brazil. Acta Hort. 872:147–150.

Bassil, N.V., J.D. Postman, K.E. Hummer, J. Mota, D. Sugar, and R. Williams. 2011. Quince (*Cydonia oblonga*) genetic relationships determined using microsatellite markers. Acta Hort. 909:75–84.

Bertini, C.H.C.M., W.S. Almeida, A.P.M. Silva, J.W.L. Silva, and E.M. Teófilo. 2010. Multivariate analysis and selection index for identification of cowpea genotypes. Acta Sci. Agron. 32:613–619.

Bettiol Neto, J.E., R. Pio, J. Sanches, E.A. Chagas, P. Cia, and P.C. Chagas. 2011. Production and quality attributes of quince tree cultivars in the eastern of the state of São Paulo. Rev. Bras. Frutic. 33:1035–1042.
