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Cold storage of ‘Palmer’ mangoes sorted based on dry matter content using portable near infrared (VIS-NIR) spectrometer

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Abstract

The objective of this study was to use dry matter (DM) calibration models to sort ‘Palmer’ mangoes prior cold storage and to evaluate the physiological and chemical changes
during the storage period. PLS model developed with fruit from 2015/2016 season was not adequate to predict DM content in fruit from 2016/2017 (not adjusted $R^2$). Therefore, VIS-NIR spectra from 2016/2017 season were incorporated into data set and a new model was developed ($\text{RMSE}_{cv}$ of 10.5 g.kg$^{-1}$, $R^2_P$ of 0.75). With the new model, ‘Palmer’ mangoes were sorted into two maturity stages (150 g.kg$^{-1}$ and 110 g.kg$^{-1}$) which resulted in quality differences mainly in relation to DM and SSC. Portable VIS/NIR spectrometer can be used to sort fruit according to maturity stages based on DM content and this classification affect fruit quality during cold storage as fruit with higher DM (150 g.kg$^{-1}$) presented better quality than fruit with lower DM (110 g.kg$^{-1}$).

Keywords: *Mangifera indica* L., chemometrics, PLS, SSC, DM, SVR.

Practical applications

Although results can be found regarding the use of portable NIR spectrometers to estimate maturity in mango fruit, there are no studies stating the use of this method to sort fruit prior cold storage. Our results highlight that portable VIS/NIR spectrometer can be used to sort fruit according to maturity stages based on dry matter (DM) content and this classification affects fruit quality during cold storage as fruit with higher DM (150 g.kg$^{-1}$) presented better quality than fruit with lower DM (110 g.kg$^{-1}$) at the end of the storage period.

1. Introduction
Non-destructive methods have long been suggested as a means to evaluate fruit quality and near infrared (NIR) spectroscopy is one of the analytical techniques that stand out (Abbott, 1999). Therefore, many studies can be found with bench top and/or on-line NIR spectrometers estimating soluble solids content (SSC), dry matter content (DM), titratable acidity (TA), firmness, starch content, and other quality parameters in mango fruit (Schmilovitch et al., 2000; Saranwong et al., 2001; Mahayothee et al., 2004; Saranwong et al., 2004; Delwiche et al., 2008; Valente et al., 2009).

Classic studies on portable NIR spectrometers to estimate quality parameters in mangoes were reported by Mahayothee et al. (2004), Saranwong et al. (2004), and Subedi et al. (2007). More recently, a portable Luminar 5030 NIR was used by Jha et al. (2014) to assess a maturity index estimated based on soluble solids content (SSC), dry matter (DM) and titratable acidity (TA) in seven mango varieties. Rungpichayapichet et al. (2016) used a portable VIS/NIR photo-diode array spectrometer (HandySpec Field 1000, tec5AG) to study mango fruit quality and maturity and good results were reported for SSC prediction (standard error of prediction (SEP) of 1.2% and a correlation coefficient (R²) of 0.90), for firmness prediction (SEP of 4.22 N and R² of 0.82), and for TA prediction (SEP of 0.38% and R² of 0.74). Marques et al. (2016) studying ‘Tommy Atkins’ mangoes used a portable MicroNIR 1700 to predict SSC, DM, TA, and firmness with low root mean square error of prediction (RMSEP), 0.92 °Brix, 0.51%, 0.17%, and 12.2 N, respectively. Santos Neto et al. (2017) reported for the first time the use of a portable F-750 to predict DM in ‘Palmer’ mango with good results (root mean square error of cross validation (RMSECV) of 8.3 g.kg⁻¹ and RMSECV of 8.8 g.kg⁻¹ with a R² of 0.86 and R² of 0.84). Nordey et al. (2017) reported that ‘Cogshall’ mango quality varies with pre and post-harvest practices, and the differences in SSC, DM, hue angle, TA and firmness were determined using a portable LABSPEC 2500 NIR spectrometer. More robust results were reported by Walsh & Subedi (2016) with portable VIS/NIR
spectrometer used to in field DM content in mango fruit of different varieties with a RMSEcv of 0.68% and a R² of 0.94.

Although results can be found regarding the use of portable NIR spectrometers to estimate maturity in mango fruit, there are no studies stating the use of this method to sort fruit prior cold storage. Mango maturity stage estimation by means of portable NIR spectroscopy should be accurate as maturity plays an important role during cold storage as the susceptibility to chilling injury varies according to mango maturity stages (Medlicott et al., 1988; Kader, 2003). According to Mohammed & Brecht (2002), the symptoms of chilling injury in mangoes are related to skin discoloration (grayish scald-like), skin pitting, uneven ripening, reductions in the level of carotenoids, aroma, and flavor during ripening. These authors reported that immature mango fruit, characterized by having shoulders below the pedicel insertion, showed chilling injury symptoms after 18 days at 5°C. According to Brecht & Yahia (2009), mature-green mangoes stored under low temperature (0°C) for one day or for few weeks at temperatures bellow 12°C can develop chilling injury. On the other hand, fully ripe fruit can be stored at 8-10°C without showing such injury (Paull & Duarte, 2011). Mango is a climacteric and perishable fruit which ripen quickly at ambient temperature and their quality can only be maintained for 8 days under these conditions (Kader, 2003). Cold storage can be used to extend the shelf-life of mangoes for up to 16 days, but due to the development of chilling injury at temperatures below 13°C (Miltra & Baldwin, 1997), the temperatures used to transport mangoes are not low enough to delay ripening, decay and senescence (Brecht & Yahia, 2009).

Therefore as it is essential to develop standard maturity indices for mangoes for a particular cultivar, growing region and for local or export markets (Yahia, 2011), and the importance of an accurate maturity stage determination prior cold storage, the objective of this study was to use the calibration models for DM content prediction of ‘Palmer’ mango
developed by Santos Neto et al. (2017) to sort mangoes prior cold storage and to evaluate the physiological and chemical changes during the storage period of 14 days similar to maritime shipment from Brazil to Europe.

4. Material and methods

4.1. Plant material

‘Palmer’ mango (*Mangifera indica* L.) fruit were harvested in a commercial orchard located at Cândido Rodrigues (21°19’21” South, 48°38’2” West, 671 m altitude), São Paulo State, Brazil. The panicles were marketed when mango trees were in full bloom and fruit were harvest after 139 days after bloom (DAB).

4.2. Spectra acquisition using portable NIR spectrometer

Prior to the cold storage, 20 fruit were harvest (125 DAB) and NIR spectra were collected according to the methodology described by Subedi et al. (2007) and Santos Neto et al. (2017) using a portable F-750 (Felix Instruments, Washington, USA), on the wavelength range of 310 to 1,100 nm, using interactance as optic configuration and a resolution of 8-13 nm. The light source was a halogen lamp.

The dry matter (DM) content was determined as reported by Santos Neto et al. (2017) and the PLS model described by these authors was used to predict the maturity stages based on DM content. A second harvest prior to the cold storage experiment was carried out (132 DAB) and 20 more fruit were evaluated according to the previous description. The NIR spectra of both prior harvests (125 and 132 DAB) were incorporated into the data set and a new PLS model was developed using full cross validation on the spectral range of 699-981 nm without applying any pre-processing according to Santos Neto et al. (2017).
For the cold storage experiment, a total of 430 fruit were harvested at 139 DAB, the NIR spectra were collected using the portable F-750 NIR spectrometer, and the maturity stages were determined by DM prediction using the new PLS model. Following the recommendations that mango fruit have to be harvested with 150 g.kg\(^{-1}\) DM (Walsh, 2016), the fruit were sorted into two classes, as such: i. fruit with 150 g.kg\(^{-1}\) DM, and ii. fruit with 110 g.kg\(^{-1}\) DM (commonly observed in export mangoes in São Paulo State, Brazil).

4.3. Maturity stage prediction - chemometrics

The NIR spectra obtained in the first harvest (125 DAB) was used as a prediction set applying the DM calibration model developed by Santos Neto et al. (2017). The Unscrambler version 10.3 (Camo, Oslo, Norway) was used for data analysis and the prediction performance was evaluated according to the coefficient of determination (R\(^2\)) and the root mean square error of prediction (RMSEP) as stated by Golic & Walsh (2006), and Nicolaï et al. (2007). As the DM prediction results were not satisfactory [high RMSEP and SEP values, and not adjusted (NA) R\(^2\)], the NIR spectra of the first harvest was incorporated into the data set and a new full cross validation model was developed using a partial least squares (PLS) regression and support vector regression (SVR). The performance of the new model was evaluated based on the coefficient of determination of cross validation (R\(^{CV}\)\(^2\)), the root mean square error of cross validation (RMSE\(_{CV}\)), and RMSEP. To evaluate the new model, a second harvest was carried out (132 DAB) and the prediction procedure repeated. Again, the DM prediction was not satisfactory and the NIR spectra of the second harvest was incorporated into the data set and a new PLS model for DM prediction was developed. Finally, the new model with NIR spectra from 2016 and 2017 was used to predict the maturity stages based on DM content of the 430 fruit used in the cold storage experiment. The descriptive statistics for the two maturity stages can be seen in Table 1.
4.4. Reference analysis – dry matter

On the same location where the VIS-NIR spectra were obtained, samples of 27 mm in diameter and with 10 mm of depth were collected for dry matter (DM) determination (Subedi et al., 2007). Mango epidermis (1-2 mm thick) was removed using a potato peeler and the DM content determined by the samples weight loss after 48 hours of oven dry at 105 °C (Santos Neto et al., 2017).

4.5. Cold storage

Due to mango sensibility to temperatures below 13 °C (Miltra & Baldwin, 1997), ‘Palmer’ mangoes were stored in a cold room at 12.3±0.4 °C and 69.9±4.1% RH for up to 14 days. After this period the fruit were transferred to ambient conditions (21.6±4.2 °C and 67.6±4.5 % RH) for 7 days simulating the commercialization period.

From a total of 430 harvested fruit, 66 were sorted as containing 150 g.kg⁻¹ DM and 70 as containing 110 g.kg⁻¹ DM (Table 1). The experiment was set up in a completely randomized design (CRD) in a factorial arrangement 2 (maturity stages: 150 g.kg⁻¹ DM and 110 g.kg⁻¹ DM) x 3 (withdraws: 0, 7, 14 days) with 10 repetitions (fruit). For the fruit transferred to ambient it was used a CRD with 2 treatments (maturity stages: 150 g.kg⁻¹ DM and 110 g.kg⁻¹ DM) and 5 repetitions (fruit).

4.6. Quality evaluations

4.6.1. Respiration

A respirometer was used for the respiration rate (mg.CO₂.kg⁻¹.h⁻¹) determination. Three fruit from each treatment were individually set into a hermetical plastic jar and air was pumped through the jars. The air passed through a 200 g.kg⁻¹ (w/v) calcium hydroxide (CaO₂) solution, and through a 50 g.kg⁻¹ (w/v) potassium permanganate (KMnO₄) solution prior
entering the jars containing the fruit. The air passed through the jars and the outlet tube was
let inside a 0.1 N potassium hydroxide (KOH) solution for one hour. Before and after this
period the CO₂ content absorbed by the KOH solution was determined by titration and the
respiratory rate calculated according to Bleinroth et al. (1976), as such:

\[
\frac{2.2 \times (B - A) \times V_1}{P \times T \times V_2}
\]

Where: B is the volume (mL) of HCl before one hour, A is the volume (mL) of HCl
after one hour, V₁ is the total volume of KOH (mL), V₂ is the volume of KOH (mL) used in
the titration, P is the fruit mass (kg), T is the time (hour), and 2.2 is the factor of CO₂ (44/2)
equivalent times the HCl (0.1N) volume.

This analysis was carried out each two days during cold storage and after transfer to
fruit to ambient condition.

**4.6.2. Fresh weight loss**

Fresh fruit weight loss (FWL) was determined based on the difference in fruit mass
from the different withdrawals (0, 7, 14 days, and after 7 days in ambient) with 10 repetitions
(fruit) per treatment. The fruit mass was determined using a semi-analytical balance with a
precision of 0.01 g (Marte, model AS 2000, São Paulo, Brazil).

**4.6.3. Colour**

Mango skin colour was determined using a Minolta colorimeter (Model CR-400, Minolta Corp., Osaka, Japan) with an 8 mm aperture. The L*, a*, b* color parameters were
used to obtain the luminosity (L*), chromaticity and hue angle (McGuire, 1992). Two
readings were taken from each fruit on opposite sides of the equatorial region.

**4.6.4. Firmness**
Fruit firmness determination was carried were on opposite sides of the equatorial region of each mango after removing the skin according to Watkins & Harman (1981). An Effegi Fruit Tester penetrometer (Bishop FT 327 Penetrometer, Alfonsine, Italy) with an 8.0 mm tip was used and the results were expressed in Newton (N).

4.6.5. Physico-chemical analysis

The pulp of the mango fruit from the different withdrawals (0, 7, 14 days, and after 7 days in ambient) was homogenized and used to soluble solids content (SSC) determination using a digital refractometer PR-101α (Atago, Tokyo, Japan) according to the AOAC method proc. 920.151 (AOAC, 1997). Titratable acidity (TA) determination was carried out using AOAC method 932-12 (AOAC, 1997), which allowed the calculus of the SSC/TA ratio. The pH was also determined (AOAC, 1997-proc 945-27) and the vitamin C content was determined using Tillmans method (Strohecker & Henning, 1967) with the results expressed as g.kg⁻¹.

4.6.6. Sensory evaluation

The external and internal appearance of the mango fruit were evaluated by a untrained sensory panel (n=20) using a hedonic scale of 9 points, as such: 9 - like extremely, 8 - like very much, 7 - like moderately, 6 - like slightly, 5 - neither like nor dislike, 4 - dislike slightly, 3 - dislike moderately, 2 - dislike very much, and 1 - dislike extremely. This evaluation was carried out in the different withdrawals (0, 7, 14 days, and after 7 days in ambient) (Dutcosky, 2013).

4.7. Statistical analysis

The data was subjected to analysis of variance (ANOVA) using the PROC MIXED procedure of SAS (1999) and the means compared using Tukey’s test with 5% probability.
The data of the fruit transfer to ambient temperature was subjected to ANOVA using the GLM procedure of SAS (1999) and the means compared using Tukey’s test with 5% probability.

5. Results and discussion

5.1. Maturity stage prediction

The determination of ‘Palmer’ mango maturity stage using VIS-NIR portable spectrometer was carried out based on our previous study (Santos Neto et al., 2017) with fruit harvested in the 2015/2016 season. Although good results were reported, RMSE_C of 8.3 g.kg\(^{-1}\) and RMSE_{cv} of 8.8 g.kg\(^{-1}\) with a R\(^2\) of 0.86 and R\(^2\)_{cv} of 0.84 (Santos Neto et al., 2017), Peirs et al. (2002) stated that the seasonal variability is an important source of variation and must be taken into account to develop robust prediction models. Therefore, prior to the cold storage, 20 fruit were harvested from the 2016/2017 season and mango maturity was predicted based on DM content using Santos Neto et al. (2017) results (Figure 1A).

Based on the prediction performance the PLS model developed with fruit from 2015/2016 season, it was not possible to predict DM in fruit from 2016/2017 as the R\(^2\) was not adjusted (NA) and the RMSEP and SEP values sharply increased to 55.6 g.kg\(^{-1}\) and 109.3 g.kg\(^{-1}\), respectively (Figure 1A). These results are in agreement with Peirs et al. (2002), which means, seasonal variability is an important source of variation and have to be taken into consideration in developing calibration models. Both seasons were quite similar in terms of average temperatures. However, in 2015/2016 it was observed higher precipitations (192.3 mm) in relation to 2016/2017 (116.3 mm), this might have affected the sunlight hours and relative humidity (Table 2). Overcast weather conditions resulted in less sunlight and reduce fruit development rates. The differences in sunlight also affect photosynthesis and DM
accumulation, which might have contributed for the differences found between fruits from different harvest seasons.

To solve the lack of robustness, the VIS-NIR spectra from the 20 fruit harvested 125 DAB were incorporated into the calibration set obtained in 2015/2016 and a new PLS model was developed, similar to Santos Neto et al. (2017), Figure 1B. With this procedure it was observed that the PLS model performance was inferior than what was reported in 2015/2016, which means the RMSE\textsubscript{C} increased from 8.3 g.kg\textsuperscript{-1} to 12.1 g.kg\textsuperscript{-1}, RMSE\textsubscript{cv} from 8.8 g.kg\textsuperscript{-1} to 12.6 g.kg\textsuperscript{-1}, and R\textsuperscript{2} \textsubscript{c} value reduced from 0.86 to 0.67 (Figure 1B).

Similarly, a second harvest was carried out at 132 DAB prior mango cold storage and the maturity stages were predicted using the new PLS model (Figure 2A). However, even incorporating VIS-NIR spectra from 2016/2017 into the data set, the new PLS model did not perform well and the DM content could not be accurately predicted as the R\textsuperscript{2} was not adjusted (NA) and the RMSE\textsubscript{P} and SEP values increased to 32.5 g.kg\textsuperscript{-1} and 61.1 g.kg\textsuperscript{-1}, respectively (Figure 1A). These values were lower than when the PLS model of 2015/2016 was firstly used to predict the DM content of the fruit from 2016/2017, though. Therefore, the strategy of incorporating new sources of variability improves the prediction capability and accuracy (Nicolaï et al., 2007; Pasquini, 2003). However, the RMSE\textsubscript{P} and SEP values were too high and the VIS-NIR spectra from the second harvest was also incorporated into the data set and a new PLS model was developed following the same procedure previously described (Figure 2B). By incorporating the VIS-NIR spectra of the second harvest from 2016/2017 season it was observed a slight better performance as the RMSE\textsubscript{C} and RMSE\textsubscript{cv} values reduced from 12.1 g.kg\textsuperscript{-1} to 10 g.kg\textsuperscript{-1} and from 12.6 g.kg\textsuperscript{-1} to 10.5 g.kg\textsuperscript{-1}, respectively (Figure 1B, 2B). The R\textsuperscript{2} \textsubscript{c} and R\textsuperscript{2} \textsubscript{P} increased to 0.77 and 0.75, respectively (Figure 1B, 2B).
To show the differences existing between batches, the VIS-NIR spectra obtained with ‘Palmer’ mangoes harvested in 2015/2016 and 2016/2017 seasons were submitted to principal component analysis (PCA) and a clear group difference was observed (Figure 3). The principal components 1 and 2 (PC1 and PC2) represented 99% of the explained variance and the PC1 was responsible for 92% and the PC2 for 7% of that (Figure 3). Fruit harvested in 2015/2016 grouped on the right hand side of the PC1 and fruit harvested in 2016/2017 on the left hand side quadrant with clear group segregation. According to Wang et al. (1991), one of the main factors that affect the performance of prediction models are samples coming from different batches. Regarding NIRS involving fresh fruit, this factor is probably the most important as fruit are matrixes subjected to variability within the plant (age, load, position, light, etc.), variability within orchards (soils type, nutrition, and climatic conditions), maturity stages and seasonal variability (Peirs et al., 2002). The results previously reported regarding the problems involving DM content prediction in ‘Palmer’ mangoes (Figure 1A and 2A) coming from different batches are in agreement with Wang et al. (1991) and Peirs et al. (2002).

Finally, fruit were harvest and prior the cold storage the maturity stage was predicted using the new PLS model. To sort the fruit into two maturity stages based on DM content (150 g.kg⁻¹ and 110 g.kg⁻¹) the RMSEP value of 12.6 g.kg⁻¹ was added and subtracted from the target DM contents. Therefore, the fruit were sorted in the range of 137.4 to 162.6 g.kg⁻¹ for the 150 g.kg⁻¹ DM content and in the range of 97.4 to 122.6 g.kg⁻¹ for the 110 g.kg⁻¹ DM content. It is worth to mention that only 15.35% of the fruit were classified as 150 g.kg⁻¹ DM and 16.28% with 110 g.kg⁻¹ DM (Table 1), what represented a fruit loss of 84.65% and 83.72%, respectively. These results highlight the importance of using portable NIR spectrometer to sort fruit when they are still in the fields as only those with the established DM content and/or
other quality parameter would be harvested, and transported to the packing house, a vantage already reported by Subedi et al. (2007) for other mango cultivars.

5.2. Cold storage

5.2.1. Respiratory activity

The respiratory activity (mg CO₂.kg⁻¹.h⁻¹) of ‘Palmer’ mangoes from both maturity stages was not significant different during cold storage and after transfer to ambient (Figure 4). During cold storage the respiratory activity varied greatly for fruit from both maturity stages, and it was not observed a climacteric peak as typically reported in mangoes (Kader, 2003; Chitarra & Chitarra, 2005; Paull & Duarte, 2011). Teixeira & Durigan (2011) also did not observed the climacteric peak during ‘Palmer’ mango storage at 12.8 °C for 28 days under controlled atmosphere (CA), and the respiration rate (21 kPa O₂) was similar to the fruit with 150 g.kg⁻¹ and 110 g.kg⁻¹ DM (Figure 4).

When fruit of both maturity stages were transfer to ambient the respiration rate significantly increased from 6.72±1.50 mg CO₂.kg⁻¹.h⁻¹ to and 8.56±0.67 mg CO₂.kg⁻¹.h⁻¹ (Figure 4). Teixeira & Durigan (2011) also reported increments in respiration rate of ‘Palmer’ mangoes when fruit were transfer to ambient after cold storage. However, the respiration rates reported by Teixeira & Durigan (2011) and Teixeira et al. (2018) were much higher than our results as these authors used immature mangoes and it might have affected the physiological activity (Award, 1993). In addition, the high fresh weight loss (Figure 5) might have affected the respiration and the other quality parameters (Table 2).

5.2.2. Fresh weight loss
The fresh weight loss (FWL) constantly increased during the cold storage period without significant differences between the maturity stages (Figure 5).

FWL reached 9.3% and 11.1% for fruit with 150 g.kg$^{-1}$ and 110 g.kg$^{-1}$ DM on the 16 day of cold storage, respectively (Figure 5). Although any significant difference was observed between maturity stages, numerically the FWL of the fruit with 110 g.kg$^{-1}$ DM was superior then with 150 g.kg$^{-1}$ DM (Figure 5). This difference is indicative that fruit with 110 g.kg$^{-1}$ DM were more immature as cuticle deposition takes place on more mature fruit and this process reduce moisture loss (Lashbrooke et al., 2014). Pantastico et al. (1979) reported that FWL commonly reach 14% during mango cold storage and losses over 5.0% can compromise fruit quality. If a FWL of 5.0% were considered as a threshold value, fruit with 110 g.kg$^{-1}$ DM would have had a shelf-life of only 4 days and fruit with 150 g.kg$^{-1}$ DM a shelf-life of 8 days (Figure 5). There results highlight the advantage of sorting more mature fruit for long term storage.

5.2.3. Physico-chemical parameters

The physico-chemical parameters determined during the cold storage for the ‘Palmer’ mangoes of the two maturity stages (150 g.kg$^{-1}$ and 110 g.kg$^{-1}$ DM) can be seen at Table 3.

Regarding the colour parameters, it was not observed significant differences between maturity stages for a* and hue angle (°h), but significant differences were observed for luminosity (L*), b*, and chromaticity (Chroma*), Table 3. ‘Palmer’ mangoes with 110 g.kg$^{-1}$ DM presented fruit with dark skins colour (L* = 38.68), with more blue (b* = 13.08) blush and saturation (chroma = 39.48) than fruit with 150 g.kg$^{-1}$ DM (L* = 36.55, b* = 11.39, and chroma = 37.41). Although the magnitude of the differences were small, it is possible to state that fruit with 110 g.kg$^{-1}$ DM were more immature than fruit with 150 g.kg$^{-1}$ DM. Colour has long been used as a maturity index in mangoes (Malevski et al., 1977) and maturity stages can
actually be predicted by using CIE colour parameters (Jha et al., 2007). Therefore, the use of a portable NIR spectrometer to sort ‘Palmer’ mangoes according to DM content indeed resulted in differences in maturity. On the other hand, all colour parameters did not change during cold storage and it was not observed significant interactions between maturity stages and withdraws (Table 3). Possibility during cold storage the low temperatures might have affected ‘Palmer’ mangoes colour changes as ‘Kensington Pride’ mango carotenoid synthesis was reduced under temperatures storage (O’Hare, 1995), similar to other mango varieties (Thompson, 1971; Medlicott et al., 1986). In addition, the elevate FWL lead the fruit to become withered and dehydrated after 14 days of cold storage, and the metabolic processes might have been affected by the losses (Wills et al., 1998).

The differences in maturity stages can also be observed as SSC and DM (Table 3). As fruit were deliberated sorted based on DM content using the PLS model, a significant difference was observed for this parameter, but the reference results were lower than the established DM content for both maturity stages, which means that the fruit with 110 g.kg\(^{-1}\) DM actually have 122.9 g.kg\(^{-1}\) and fruit with 150 g.kg\(^{-1}\) DM have 134.4 g.kg\(^{-1}\) (Table 3). The SSC was also higher in fruit with 150 g.kg\(^{-1}\) DM (7.92 %) in relation to fruit with 110 g.kg\(^{-1}\) DM (7.39 %), but the other quality parameters (TA, pH, ration, vitamin C content, and firmness) did not present significant differences (Table 3). Again by using NIRS was possible to sort fruit into two maturity stages with distinct quality characteristics.

During cold storage it was not observed any significant interaction between maturity stages and withdraws for all physic-chemical parameters (Table 3). However, it was observed significant differences for pH, SSC, TA, and vitamin C (Table 3). pH values reduced during cold storage and TA content increased (Table 3). The modifications are not in agreement with what is commonly described during mango fruit ripening as normally it is reported increases in pH and reductions in TA contents (Medlicott et al., 1986), including for ‘Palmer’ mangoes.
(Megale, 2002). O’Hare (1995), studying the effect of storage temperatures in ‘Kensington Pride’ mangoes reported that at 13 °C the TA content were very high even after 20 days of storage. Melo Neto et al. (1999) also observed high TA content in ‘Palmer’ mangoes after 28 days of storage at 12 °C. Therefore, the cold storage might have affected the ripening process and consequently organic acids retention, including the ascorbic acid (vitamin C), Table 3.

The SSC increased during cold storage from 6.2 % on the first day to 9.9% on the 14 day (Table 3). In general during mango storage is reported an increase in SSC due to starch degradation (Khader, 1992; Mitcham & McDonald, 1992). The observed SSC of 9.9 % was not high enough as the ideal SSC for mango ranges from 10 % (Medlicott et al., 1988) to 13 %, and even higher values of 18.5% (Corrêa, 1992). According to Sañudo et al. (1997), by the time of ‘Tommy Atkins’ mango harvest aiming fruit export the SSC might range from 7 % to 8 %, and Makani (2009) stated that a SSC of 13.5 % as a threshold content for consumers to accept ‘Tommy Atkins’ mangoes. Possibly as the reference DM content, mainly for the 150 g.kg\(^{-1}\) DM maturity stage, was lower than was expected (134.4 g.kg\(^{-1}\)), the starch hydrolyses was not sufficient to warrantee a recommended SSC. Therefore, it is imperative a continuous development of the DM prediction model aiming improve robustness and accuracy in order to get results as close as possible to the target values.

5.3. Ambient storage

After cold storage the ‘Palmer’ mango fruit were transfer to ambient conditions (21.6+4.2 °C and 67.6+4.5 % HR) for 7 days simulating fruit commercialization (Table 4). In ambient, fruit from both maturity stages lost more moisture and the FWL reached 16.4 % and 18.1% for fruit with 150 g.kg\(^{-1}\) and 110 g.kg\(^{-1}\), respectively (Table 4). Therefore, fruit were completely withered, dehydrated and with compromised appearance.
The initial colour differences observed between maturity stages (Table 3) disappeared and any significant difference was observed (Table 4). Fruit presented normal colour development with dark skins \( (L^* = 35.90 - 37.43) \), higher saturation (chroma = 36.74 – 38.14), and with a typical ‘Palmer’ purple skin colour \( (\gamma = 266.71 - 274.08) \), Table 4. Colour changes were accelerated at ambient similar to previous reports on ‘Palmer’ mango cold storage (Melo Neto et al., 1999; Jeronimo & Kanesiro, 2000).

The differences in terms of DM content also disappeared in ambient and the only observed significant difference was related to TA (Table 4). The DM content increased in both maturity stages and reached 130.1 and 143.0 g.kg\(^{-1}\) for fruit with 150 g.kg\(^{-1}\) and 110 g.kg\(^{-1}\), respectively (Table 4). DM content might have increased as a result of the fresh weight loss (FWL). However, only the fruit with 150 g.kg\(^{-1}\) DM content get close to the recommendation stated by Walsh et al. (2004), which means, 140 g.kg\(^{-1}\), but Walsh (2016) recommended higher DM contents (150 g.kg\(^{-1}\)).

Starch hydrolysis might have affected the SSC which increase to 11.47 - 11.61 % in fruit with 150 g.kg\(^{-1}\) and 110 g.kg\(^{-1}\), respectively (Table 4). These values are much closer to the range of 10 - 13 % recommended by Medlicott et al. (1988). However, lower than what Makani (2009) stated as a threshold content for consumers to acceptance (13.5 %), and lower than Teixeira & Durigan (2011) reported for mature ‘Palmer’ mangoes (14.2 %). On the other hand, the significant differences in TA content might indicate that fruit with 110 g.kg\(^{-1}\) DM \( (10.2 \text{ g.kg}^{-1}) \) as less mature then fruit with 150 g.kg\(^{-1}\) DM \( (7.6 \text{ g.kg}^{-1}) \) because TA contents generally reduce during mango ripening (Jeronimo & Kanesiro, 2000; Paull & Duarte, 2011).

**5.4. Sensorial evaluation**

The untrained panel was able to differentiate the external and internal appearance of the ‘Palmer’ mango from both maturity stages (Figure 6).
The fruit with 150 g.kg$^{-1}$ DM were better evaluated than fruit with 110 g.kg$^{-1}$, either for external or for internal appearance during cold storage (0, 7, and 14 days) and after transfer to ambient (21 day), Figure 6B. The more advanced ripening stage in the fruit with 150 g.kg$^{-1}$ DM was more evident when the panelist evaluated the internal appearance at 7 days in the ambient as the pulp colour turned more yellow and the score 8 “like very much” was attributed to the fruit. On the other hand, for the fruit with 110 g.kg$^{-1}$ DM, the panelist attribute a score 5 “neither like nor dislike” (Figure 6A).

6. Conclusion

It was not possible to predict dry matter (DM) content of ‘Palmer’ mangoes harvest in 2016/2017 season using the PLS model developed in 2015/2016 (Santos Neto et al., 2017), and a new model was developed (RMSEC of 10 g.kg$^{-1}$, RMSEcv of 10.5 g.kg$^{-1}$, $R^2_c$ of 0.77, and $R^2_P$ of 0.75). With the new model was possible to sort ‘Palmer’ mangoes into two maturity stages (150 g.kg$^{-1}$ and 110 g.kg$^{-1}$) which resulted in quality differences mainly in relation to DM and SSC. Sensorialy fruit with 150 g.kg$^{-1}$ DM content were better evaluated then fruit with 110 g.kg$^{-1}$, and scores of 8 “like very much” for internal appearance and 7 “like moderately”, for external appearance were attributed. The elevated fresh weight loss (FLW) observed during cold storage affected fruit quality of fruit from both maturity stages (150 g.kg$^{-1}$ and 110 g.kg$^{-1}$). Finally, portable VIS/NIR spectrometer can be used to sort fruit according to maturity stages based on DM content and this classification affect fruit quality during cold storage as fruit with higher DM (150 g.kg$^{-1}$) presented better quality than fruit with lower DM (110 g.kg$^{-1}$).

Acknowledgment
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7. References


Table 1 Descriptive statistics of the two ‘Palmer’ mangoes maturity stages established based on dry matter (DM) content of fruit harvested in 2016/2017 season.

<table>
<thead>
<tr>
<th>Maturity stage</th>
<th>Total</th>
<th>Sorted</th>
<th>Mean</th>
<th>Maximum</th>
<th>Minimum</th>
<th>SD</th>
</tr>
</thead>
<tbody>
<tr>
<td>150 g.kg(^{-1}) DM</td>
<td>430</td>
<td>66</td>
<td>14.62</td>
<td>15.99</td>
<td>14.01</td>
<td>0.51</td>
</tr>
<tr>
<td>110 g.kg(^{-1}) DM</td>
<td>430</td>
<td>70</td>
<td>11.61</td>
<td>11.99</td>
<td>10.06</td>
<td>0.36</td>
</tr>
</tbody>
</table>

\(^a\)SD = standard deviation.

Table 2. Meteorological data of 2015/2016 and 2016/2017 mango harvest seasons of Jaboticabal – SP.

<table>
<thead>
<tr>
<th>Season</th>
<th>Pressure (hPa)</th>
<th>T(_{\text{max}}) (°C)</th>
<th>T(_{\text{min}}) (°C)</th>
<th>T(_{\text{mean}}) (°C)</th>
<th>RH (%)</th>
<th>Precipitation (mm)</th>
<th>Sunlight (h)</th>
</tr>
</thead>
<tbody>
<tr>
<td>2015/2016</td>
<td>942.50</td>
<td>30.89</td>
<td>18.87</td>
<td>23.82</td>
<td>72.62</td>
<td>192.30</td>
<td>201.19</td>
</tr>
<tr>
<td>SD*</td>
<td>1.84</td>
<td>1.88</td>
<td>2.71</td>
<td>2.00</td>
<td>9.29</td>
<td>145.84</td>
<td>38.73</td>
</tr>
<tr>
<td>2016/2017</td>
<td>942.15</td>
<td>30.83</td>
<td>17.62</td>
<td>23.20</td>
<td>68.41</td>
<td>116.31</td>
<td>231.47</td>
</tr>
<tr>
<td>SD*</td>
<td>0.21</td>
<td>1.32</td>
<td>2.90</td>
<td>1.97</td>
<td>7.30</td>
<td>86.25</td>
<td>37.32</td>
</tr>
</tbody>
</table>

\(^*\)Standard deviation.
Table 3. Physico-chemical quality parameters of ‘Palmer’ mangoes of two maturity stages (150 g.kg\(^{-1}\) and 110 g.kg\(^{-1}\) DM) stored at 12.3±0.4°C and 69.9±4.1% RH for 14 days.

<table>
<thead>
<tr>
<th>Main effects</th>
<th>L*</th>
<th>a(^*)</th>
<th>b(^*)</th>
<th>Hue(^a)</th>
<th>C(^b)</th>
<th>pH</th>
<th>SSC (%)(^c)</th>
<th>TA(^d)</th>
<th>SSC/TA</th>
<th>Firmness (N)</th>
<th>DM (g.kg(^{-1}))e</th>
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<tbody>
<tr>
<td>Maturity stages (M)</td>
<td></td>
<td></td>
<td></td>
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<td></td>
<td></td>
</tr>
<tr>
<td>110 g.kg(^{-1}) DM</td>
<td>38.68 a</td>
<td>-4.41</td>
<td>13.08 a</td>
<td>264.45</td>
<td>39.48 a</td>
<td>2.92</td>
<td>7.39 b</td>
<td>0.81</td>
<td>9.71</td>
<td>127.4</td>
<td>122.9 b</td>
</tr>
<tr>
<td>150 g.kg(^{-1}) DM</td>
<td>36.55 b</td>
<td>-1.83</td>
<td>11.39 b</td>
<td>268.49</td>
<td>37.41 b</td>
<td>2.99</td>
<td>7.92 a</td>
<td>0.73</td>
<td>12.48</td>
<td>124.2</td>
<td>134.4 a</td>
</tr>
<tr>
<td>F Test</td>
<td>4.88*</td>
<td>3.37NS</td>
<td>5.89*</td>
<td>3.15NS</td>
<td>4.16*</td>
<td>3.81NS</td>
<td>3.45*</td>
<td>4.19NS</td>
<td>1.88NS</td>
<td>0.48 NS</td>
<td>62.5*</td>
</tr>
<tr>
<td>Storage (S)</td>
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<td></td>
<td></td>
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<tr>
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<td>37.93</td>
<td>-3.74</td>
<td>12.74</td>
<td>265.51</td>
<td>38.66</td>
<td>3.25 a</td>
<td>6.22 c</td>
<td>0.64 b</td>
<td>10.38</td>
<td>128.9</td>
<td>124.2</td>
</tr>
<tr>
<td>7</td>
<td>37.52</td>
<td>-2.36</td>
<td>12.35</td>
<td>267.80</td>
<td>38.59</td>
<td>3.28 a</td>
<td>6.85 b</td>
<td>0.79 a</td>
<td>11.26</td>
<td>121.8</td>
<td>130.1</td>
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<tr>
<td>14</td>
<td>37.20</td>
<td>-3.02</td>
<td>11.44</td>
<td>266.49</td>
<td>37.89</td>
<td>2.35 b</td>
<td>9.95 a</td>
<td>0.88 a</td>
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<td>126.4</td>
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<tr>
<td>F Test</td>
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<td>0.67NS</td>
<td>0.54NS</td>
<td>0.18NS</td>
<td>188.86 **</td>
<td>156.43 **</td>
<td>8.90 **</td>
<td>0.19NS</td>
<td>0.98 NS</td>
<td>8.6 NS</td>
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<tr>
<td>Interaction</td>
<td></td>
<td></td>
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<td></td>
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<tr>
<td>M x D</td>
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<td>2.64NS</td>
<td>0.79NS</td>
<td>2.26NS</td>
<td>0.07NS</td>
<td>4.04NS</td>
<td>1.74NS</td>
<td>0.91 NS</td>
<td>0.44 NS</td>
</tr>
</tbody>
</table>

L* = luminosity, a\(^*\) hue angle, b\(^*\) chromaticity, c\(^*\) soluble solids content, d\(^*\) titratable acidity, e\(^*\) dry matter. Average values with the same letter within the columns are not statistically different by Tukey’s test (p<0.05). Values in the column without letter are not statistically different by Tukey’s test (p<0.05). NS = no significant.
Table 4. Physico-chemical quality parameters of ‘Palmer’ mangoes of two maturity stages (150 g.kg\(^{-1}\) and 110 g.kg\(^{-1}\) DM) stored at 12.3\(\pm\)0.4°C and 69.9\(\pm\)4.1% RH for 14 days and seven days at ambient conditions (21.6\(\pm\)4.2°C and 67.6\(\pm\)4.5% UR).

<table>
<thead>
<tr>
<th>Main effects</th>
<th>(L^*)</th>
<th>(a^*)</th>
<th>(b^*)</th>
<th>Hue(^a)</th>
<th>C(^b)</th>
<th>pH</th>
<th>SSC (%)(^c)</th>
<th>TA(^d)</th>
<th>SSC/TA</th>
<th>Firmness((N))</th>
<th>DM (g.kg(^{-1}))(^e)</th>
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<tbody>
<tr>
<td>110 g.kg(^{-1}) DM</td>
<td>37.43</td>
<td>-2.78</td>
<td>11.71</td>
<td>266.71</td>
<td>38.14</td>
<td>2.42</td>
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<td>1.02 a</td>
<td>11.92</td>
<td>57.25</td>
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<td>150 g.kg(^{-1}) DM</td>
<td>35.90</td>
<td>1.41</td>
<td>9.45</td>
<td>274.08</td>
<td>36.74</td>
<td>2.52</td>
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<td>0.76 b</td>
<td>15.84</td>
<td>73.55</td>
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<tr>
<td>Teste F</td>
<td>0.29(^{NS})</td>
<td>1.24(^{NS})</td>
<td>0.84(^{NS})</td>
<td>0.25(^{NS})</td>
<td>0.99(^{NS})</td>
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<td>0.05(^{NS})</td>
<td>5.51*</td>
<td>2.46(^{NS})</td>
<td>2.05(^{NS})</td>
<td>0.56(^{NS})</td>
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</table>

\(L^*\) = luminosity, \(^a\) hue angle, \(^b\) chromaticity, \(^c\) soluble solids content, \(^d\) titratable acidity, \(^e\) dry matter. Average values with the same letter within the columns are not statistically different by Tukey’s test (p<0.05). Values in the column without letter are not statistically different by Tukey’s test (p<0.05). \(NS = \) no significant.
Figure 1. Dry matter prediction performance of the PLS model developed by Santos Neto et al. (2017) using ‘Palmer’ mangoes from 2016/2017 (A). Predicted and reference DM content obtained with the new PLS model by incorporating the NIR spectra from 2016/2017 harvest (B).
Figure 2. Dry matter prediction performance of the PLS model developed by incorporating the NIR spectra from 2016/2017 (A). Predicted and reference DM content obtained with the new PLS model by incorporating the NIR spectra from the second 2016/2017 harvest (B).
Figure 3. Scores of the principal component 1 (PC1) and 2 (PC2) obtained with NIR spectra (699-981 nm) without pre-processing of intact ‘Palmer’ mangoes harvested in 2015/16 and 2016/17.
Figure 4. Respiratory activity (mg CO$_2$.kg$^{-1}$.h$^{-1}$) of ‘Palmer mangoes sorted into two maturity stages (150 g.kg$^{-1}$ and 110 g.kg$^{-1}$) during cold storage (12.3 ± 0.4 °C and 69.9 ± 4.1 % RH) for 14 days and under ambient conditions (21.6 ± 4.2 °C and 67.6 ± 4.5 % RH) for 7 days. The vertical bars indicate standard deviations of three repetitions.
**Figure 5.** The fresh weight loss (FWL - %) of ‘Palmer’ mangoes sorted into two maturity stages (150 g kg\(^{-1}\) and 110 g kg\(^{-1}\)) during cold storage (12.3 ± 0.4 °C and 69.9 ± 4.1% RH) for 14 days and under ambient conditions (21.6 ± 4.2 °C and 67.6 ± 4.5% RH) for 7 days. The vertical bars indicate standard deviations of three repetitions.
Figure 6. Sensorial evaluation of ‘Palmer’ mangoes sorted base on dry matter content (A) 110 g.kg\(^{-1}\) and (B) 150 g.kg\(^{-1}\), during in cold storage (12.3 ± 0.4 °C and 69.9 ± 4.1% RH) for 14 days and under ambient conditions (21.6 ± 4.2 °C and 67.6 ± 4.5% RH) for 7 days. The vertical bars indicate standard deviations of 20 repetitions.