

1 **Sorting olive oil based on alpha-tocopherol and total tocopherol**
2 **content using Near-Infra-Red Spectroscopy (NIRS) analysis**

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9 **Abstract**

10 Olive oil is an important vitamin E source, which shows a wide variation range.
11 Therefore the interest on distinguish classes. In this study, we assessed models based on
12 partial least squares (PLS) and discriminant analysis (PLS-DA), using near-infrared
13 spectroscopy (NIRS). Estimating the α -tocopherol and total tocopherols contents by
14 using the PLS models were suitable according to the predicting exercises, which gave
15 residual predictive deviations 2.37 and 2.01. Sorting test of olive oil in two classes by
16 α -tocopherol with the PLS model provided 99.9% success. The PLS-DA assessment for
17 the same purpose gave coefficients of predictive specificity and sensitivity for the high
18 α -tocopherol class 0.96 and 0.84, respectively. The data proves the feasibility of
19 estimating the olive oil α -tocopherol or total tocopherols contents by using NIRS.
20 Besides, these techniques can be helpful rapid methods in the industry for sorting olive
21 oils according to their vitamin E content. They are friendly to the environment, which is
22 important.

23 Key words: α -tocopherol, classification, olive oil, NIRS, tocopherols, vitamin E.

24 *Abbreviations:* AOTF, acousto-optic tunable filter; CSIC, Spanish Council for Scientific Research; 1DSG, first
25 Savitzsky-Golay derivative; 2DSG, second Savitzsky-Golay derivative; EVOO, extra virgin olive oil; FCV, full cross
26 validation; H α T, High α -Tocopherol class; InGaAs, detector using In, Ga and As chemical elements; iPLS, interval
27 partial least squares; L α T, Low α -Tocopherol class; MN, mean normalization; NIR, near infrared; NIRS, near
28 infrared spectroscopy; PCA, principal component analysis; PLS, partial least squares; PLS-DA, partial least squares
29 discriminant analysis; PLS_f, PLS factors; r , regression coefficient between the predicted and reference values; R,
30 calibration coefficient; R_{CV}, calibration coefficient from the internal cross validation; RPD, residual predictive
31 deviation; SEC, standard error of calibration; Vis/NIR, visible and near infrared; Vis/NIRS, visible and near infrared
32 spectroscopy; Vit E, vitamin E.
33

34 1. Introduction

35 Olive oil is a prominent source of vitamin E (Vit E), since it provides between 10 and
36 150 mg of α -tocopherol each 100 g. In fact, vegetable oils are the richest source of Vit
37 E according to food composition tables (Souci, Fachman & Kraut, 1994; USDA, 2007).
38 Pomace olive oil shows higher quantities than those above indicated (Perona, Arcemis,
39 Ruíz, & Catalá, 2005). A daily consumption of 25 g Virgin Olive Oil (VOO) would
40 provide almost 30% of the recommended intake of this vitamin (EFSA, 2015,
41 [www.nal.usda.gov/fnic/foodcomp/ search](http://www.nal.usda.gov/fnic/foodcomp/search)).

42 Tocopherols are present in variable quantities within the minor olive oil fraction. As an
43 example, Beltrán et al. (2010) reported total tocopherols content ranging between 8.4
44 and 46.3 mg/100 g within thirty olive cultivars, which were monitored during fruit
45 ripening for three consecutive crop seasons. Other leading sources of Vit E as sunflower
46 peeled seed and almond, contribute around 37 mg/100 g and 26 mg/100 g (Souci,
47 Fachman & Kraut, 1994).

48 Tocopherols are methylated phenols many of which have Vit E activity. In nature, Vit E
49 exists as at least eight naturally occurring compounds, including α -, β -, δ - and γ -
50 tocopherol and α -, β -, δ - and γ -tocotrienol. The α -tocopherol is the most biologically
51 active and occurs naturally as one isomer (Dutta & Dutta, 2003). It is the main isomer in
52 Europe, where the main dietary sources are olive and sunflower oils (Wagner, Kamal-

53 Eldin, & Elmadfa, 2004). In contrast, γ -tocopherol is the most common form in the
54 American diet because of a higher intake of soybean and corn oil (Jiang, Christen,
55 Shigenaga, & Ames, 2001; Wagner, Kamal-Eldin, & Elmadfa, 2004).

56 Vit E is antioxidant and it has regulatory cellular and molecular roles. As antioxidant,
57 Vit E inhibits lipid oxidation in food and organisms (Lodge, Traber, Elsner, &
58 Brigelius-Flohé, 2000) by stopping the radical oxygen species (ROS) chain reaction
59 (Wiseman, Tijburg, & Van de Put, 2002). As a result, it prevents the peroxidation of
60 polyunsaturated fatty acids from cellular and subcellular membranes. Also, α -
61 tocopherol plays an important role as antioxidant in olive oil stability (Deiana et al.,
62 2002). The biological activity of tocopherols makes them compounds that play an
63 essential role against aging (Shaidi, 2004; Jessup, Horne, Yarandi, & Quindry, 2004).

64 Improving the olive oil industry and its economy, continuously stimulates the search for
65 new technologies. The main goals are the product's quality, for which tocopherols
66 content is important. The olive oil industry has great interest on checking the quality
67 using fast and reliable techniques, both to simplify the product handling, as well as for
68 the classification and labeling. Among the various nondestructive solutions to these
69 needs, near-infrared spectroscopy (NIRS) has made major achievements. The ability of
70 NIRS for analyzing the major quality features of olive oil, such as free acidity or
71 peroxides value, has been reported (Mailer, 2004; Bendini et al., 2007, Conte et al.,
72 2008, among others). In fact, NIRS techniques are methods for these routine analyses in
73 a growing number of laboratories. NIRS is based on correlating the spectral data with
74 the analyzed feature, using multivariate models. It has several important advantages, as
75 NIRS does not need solvents or reagent, thus avoiding a major expense. It protects the
76 environment, increasingly important. Besides, NIRS techniques are rapid and can be

77 multi-parameter. Must note that using NIRS techniques needs calibrating for a defined
78 purpose, using a specific spectrometer. As well, it needs a procedure for periodic
79 validation.

80 | The more usual methods for olive oil tocopherols analysis is HPLC, according [to](#)
81 | standards ISO 9936 or IUPAC 2432, although there are not official methods. Analyzing
82 | tocopherols in animal feeds by using NIRS (González-Martín et al., 2006a; González-
83 | Martín et al., 2006b) has been reported. As well, Ayerdi-Gotor et al. (2007) suggested
84 | that NIRS could be useful to discriminate sunflower seeds according [to](#) their tocopherol
85 | levels. Besides, Szłyk et al. (2005) reported NIRS determination of α -tocopherol in
86 | several edible oils, after extraction with ethanol. Measuring olive oil tocopherols
87 | directly without sample preparation by using NIRS has not been studied up to date at
88 | the best of our knowledge.

89 Besides, from a consumer's perspective there is increasing interest in information about
90 food bioactive compounds content. Its satisfaction is a major target for the food industry
91 according to official rules (EU, 2011). The industry may wish distinguishing olive oil
92 according to tocopherols content, rather than standing a detailed tocopherols analysis.
93 This technique can provide sorting the produce, avoiding the mix of batches with
94 different tocopherols content. Later, it allows labeling the olive oil according to their
95 Vit E, as well as diversify the product. This labeling holds a potential added value,
96 either in economic terms or in trade competitiveness.

97 This study had as a first purpose to prove a new NIRS technique using PLS models, for
98 estimating α -tocopherol and total tocopherols content in olive oil. A second objective
99 was to test two alternative techniques for sorting olive oils according to their α -
100 tocopherol content, based on quantitative PLS and qualitative PLS-DA. These

101 techniques can be helpful as rapid methods for sorting olive oils in the industry
102 according to Vit E content. Thus they may be useful to the competitiveness of the
103 product.

104 **2. Material and Methods**

105 *2.1. Olive Oils*

106 An important reason for the robustness of NIRS calibrations is the statistical range of
107 the analyte. Olive oil samples were taken from different sources to guarantee that their
108 characteristics were sufficiently broad-~~enough~~. High quality Extra Virgin Olive Oils
109 (EVOO) were acquired on special markets, this group contributing with 16 samples, 11
110 of which were varietal and the remaining 5 were coupages from different varieties.
111 Olive oils normally found in the market were included, this group composed by 80
112 EVOO and 80 not virgin olive oils. Olive oil samples were provided also from a
113 collaborator industry, contributing with 20 EVOO and 25 virgin olive oils. Additionally,
114 28 lampante and 30 pomace olive oils were used to increase the diversity of –
115 tocopherols (α , β , or γ –tocopherol). Besides, a research project provided 48 EVOO
116 samples which were used for the optical configuration transfectance measurements,
117 described later. These were extracted in the Instituto de la Grasa (CSIC) from the olives
118 using a laboratory mill (MC2, Seville, Spain) based on the Abencor system (Martínez et
119 al., 1975). The samples in total used were 327.

120 *2.2. Spectral Acquisition*

121 The spectrum of every sample were acquired using two spectrometers with different
122 features, for standing results with their optical configurations. The spectrometers used

123 were Labspec (Analytical Spectral Devices Inc., Boulder) and Luminar 5030 (Brimrose
124 Corp., Maryland).

125 The temperature of a body has an important influence on the NIR radiation it reflects
126 and absorbs, thus it is decisive in NIRS (Jiang et al., 2008). Therefore, the samples were
127 taken from 4 °C storage and placed in the laboratory 18 h before processing. Before
128 recording spectra with both spectrometers, a water bath (Nahita, London, United
129 Kingdom) fixed at 33 °C for 30 min. held the 20 mL sample containers, assuring the
130 temperature stability.

131 Wavelengths in the visible spectrum can carry useful information related to the analyzed
132 parameter, since the olive oil tocopherols are pale yellow color (Budavari, 1989). This
133 was the purpose for using Labspec (Analytical Spectral Devices Inc., Boulder,
134 Colorado, USA), a Visible/NIR (Vis/NIR) spectrometer equipped with three detectors.
135 The detector for the visible range (350-1000 nm) is a fixed reflective holographic diode
136 array with a sensitivity of 512 pixels. A holographic fast scanner InGaAs detector
137 cooled at -25 °C covers the wavelength range of 1000-1800 nm. The same coupled with
138 a high order blocking filter runs for the 1800-2500 nm interval. The instrument equips
139 internal shutters and automatic offset correction, the scanning speed is 100 ms. The
140 repeatability of the instrument, expressed as standard deviation on the average
141 absorbance of five measures of a white tile between 350 and 2500 nm, is $6.00 \cdot 10^{-4} \text{ cm}^{-1}$
142 mol^{-1} . With the Labspec, the spectra were registered by transmittance from each sample
143 of EVOO directly, without any other treatment. A Hellma quartz spectrophotometric
144 cuvette with 10 mm path length held the samples while their averaged spectra were
145 acquired. The whole spectrum Vis/NIR (350–2500 nm) was registered, each spectral
146 variable matching to a 1 nm interval. Configuration for 50 spectra in continuous
147 acquisition was used, each spectral variable matching to 1 nm interval. Indico Pro

148 software (Analytical Spectral Devices Inc., Boulder, Colorado, USA) was used for this
149 purpose. The registering time is less than a minute for each sample spectrum, all steps
150 included.

151 Luminar 5030 (Brimrose Corp., Baltimore, Maryland, USA) is an AOTF (acousto-optic
152 tunable filter) NIR spectrophotometer, equipped with a transmittance post dispersive
153 optical configuration and InGaAs (1100-2300 nm) detector. The reference spectrum is
154 taken automatically by the instrument, similarly to an UV-Vis spectrophotometer dual
155 beam. The beam divides before leaving the instrument, and a small portion is sent to a
156 second detector that makes the reference. The scanning speed in Luminar 5030 is 60 ms.
157 The spectrometer has a hand-held unit, equipped with a base for optional use in the
158 laboratory. The instrument's liquid probe accessory was used. The liquid probe is in
159 stainless steel, with a threaded interchangeable optical path. The NIR radiation coming
160 from the optical fiber goes through the liquid sample, reflects in the polished stainless
161 steel surface of the optical path's cylinder. Then, it back through the liquid sample,
162 heading spectrometer detector. Thus, this is transmittance. The spectrometer set is
163 complete with its computer unit. The whole spectrum was registered, each spectral
164 variable matching to a 2 nm interval. The repeatability of the instrument, expressed as
165 standard deviation on the average absorbance of 1100 to 2300 nm of five measures of a
166 white tile, is $6.76 \cdot 10^{-4} \text{ cm}^{-1} \text{ mol}^{-1}$. The signals are acquired with software Acquire
167 (Brimrose Corp., Baltimore, Maryland, USA). Averaged spectrum were obtained for
168 each sample, resulting from a total 100 spectra matching to two measures of 50 spectra
169 each, it for both spectrometers.

170 2.3. Reference Analysis

171 | The analysis of α , β , and γ tocopherols were carried out by HPLC according [to](#)
172 standards ISO 9936 and IUPAC 2432, in the Instituto de la Grasa (CSIC). Briefly, 100
173 mg of oil was diluted with hexane to 10 mL final volume. The prepared solution was
174 filtered with Minisart RC15 (0.45 μ m pore size, Hannover, Germany), and then a
175 portion (20 μ L) of the final solution was subjected to the FLD-normal Phase HPLC. The
176 HPLC system consisted of a HP 1100 series (Hewlett-Packard, strasse 8, 76337
177 Waldbrown, Germany), G 1311A Quat pump, G1316A column oven, G1313A ALS
178 injector. Silice 5 μ m, 250x4 mm (Lichrospher 5 μ , sil 60 A, 626077-1) was used as the
179 HPLC column. The mobile phase it was hexane/isopropilic alcohol (99:1). The flow
180 rate was adjusted to 1.0 mL/min and the temperature was maintained at 25°C.
181 Tocopherols were detected by HP-FLD detector (excitation 290 nm, emission 330 nm,
182 HP1100 series, G1321-95002, Germany). All peak areas were registered using HP
183 Chemistation program 2010.

184 Calibration curves were established from patterns with different concentrations of
185 α -, β -, γ - and total tocopherols between 1 and 11.5 mg/mL in n-hexane. The standards
186 curves were linear, with a concentration range of 1-10 mg/L. These were admitted when
187 $r^2 \geq 0.999$, respectively. The -tocopherols concentrations in olive oil were calculated by
188 extrapolating the peak areas within the calibration curves. The results are expressed as
189 ppm, with one decimal.

190 The determination was made twice in each sample, and these repeats averaged. The
191 values in which there was an error of $\pm 10\%$ were eliminated. The tocopherols contents
192 are reported in mg/kg of olive oil (ppm). Analytical sensitivity of tocopherols was 2
193 ppm. The time needed for the analysis was about 20 min.

194 2.4. *Chemometrics and Calibration Procedure*

195 Principal Component Analysis (PCA) was carried out from the olive oil spectra using
196 The Unscrambler 9.7 (CAMO Software AS, Oslo, Norway). It was used both for the
197 NIR and Vis/NIR wavelengths for analyzing the possible bundling of olive oils and
198 detecting possible spectral outliers. The outliers were detected in PCA as those samples
199 with high residuals, according to the procedure described by the software previously
200 referred. Quantitative tocopherols models were built from the spectral variables visible
201 (Vis) and near infrared (NIR), by Partial Least Squares (PLS). The data from analysis of
202 virgin olive oils were used as reference. Transmittance spectral data were reduced to 8
203 nm intervals by average, transformed to absorbance and mean normalized (MN). Then,
204 treatments by first (1DSG) and second (2DSG) Savitzsky–Golay derivatives were
205 tested. These derivatives were both carried out with 3 smoothing points, and their
206 polynomial order was 2. The full cross internal validation (FCV) procedure was used.
207 The calibration set for models development excluded an external validation set. We
208 took one out of each three olive oil samples from the third one, to stand one third of the
209 total samples. Therefore, this external validation set does not engage in the
210 multivariate models. The calibration and validation sample sets at beginning were the
211 same for all the tests. Calibration models for predicting α -, β -, γ - and total tocopherols
212 were established from the spectra gained with Luminar and Labspec. The models' PLS
213 factors were set after tests, using 15 at first. These treatments were made by using The
214 Unscrambler 9.7.

215 Selecting the spectral variables involved in the models was made by consecutive cycles
216 removing those which the contribution were closer to zero. Variable selection ended in
217 the last cycle that improved the statistical model R^2_{CV} . Model fitness was assessed by
218 the closeness between their R^2 and R^2_{CV} and by the standard error of calibration (SEC).

219 2.5. *PLS Model Performance Assessment*

220 Assessing the PLS model performance was mainly according to the *r* from external
221 validation exercises. This is the correlation coefficient of the simple linear regression
222 between the analyzed and predicted values. The residual predictive deviation (RPD) was
223 considered also to aid interpreting the calibrations performance. The RPD is defined
224 according to [1] (Williams and Sobering, 1996).

$$225 \qquad \qquad \qquad \text{RPD} = \frac{\text{SD}}{\text{SEP}} \qquad \qquad \qquad [1]$$

226 Where SD is the standard deviation of the reference data from the validation set, and
227 SEP is the standard error of model performance in the validation.

228 As well, contrasting the calibration statistics from the different optical configurations
229 used allows confirming their predictive abilities. These calibrations were assessed
230 independently.

231 2.6. *Sorting Tests*

232 The spectral data from the optical analysis providing the best yields for predicting α -
233 tocopherol, were used in the sorting tests. These tests were carried out in the validation
234 set described previously. The olive oil α -tocopherol content was classified according to
235 the classes High α -Tocopherol (H α T), with α -tocopherol higher to 200 ppm, and Low
236 α -Tocopherol (L α T), lower or equal to 200 ppm. The α -tocopherol statistical mean of
237 the ~~of the~~ olive oils used in this study was about 180 ppm (Table 1). Thus, the threshold
238 was set at 200 ppm as it was above this mean~~Thus, it was fixed the threshold at 200~~
239 ~~ppm for be above this mean~~. This two way classification may be useful in the industry,
240 since the labeling would need simplicity. This separation was carried out by using the

241 quantitative α -tocopherol PLS model (M_1). The ~~assessing of~~ sorting performance ~~was~~
242 ~~by success~~ was assessed by, ~~expressed as~~ the percentage of samples in which the
243 classifications according to the predicted values were ~~coincident with~~ equivalent to the
244 classes ~~of~~ the reference values.

245 Partial Least Squares Discriminant Analysis (PLS-DA) models were established and
246 assessed as an alternative to PLS. Classification exercises in the two classes before
247 described were carried out by using this qualitative technique. These models were
248 developed from the olive oils spectra previously classified in two classes ($H\alpha T$ and
249 $L\alpha T$), which were used as class variables. Interval Partial Least Squares (iPLS)
250 procedure was tested for spectral variable selection in the PLS-DA models. The same
251 calibration and validation sets previously employed with the quantitative PLS model
252 were used, therefore allowing their comparison. PLS-DA analysis was made with PLS-
253 Toolbox 8.0 (Eigenvector Research Inc., Manson, USA), and its results were assessed
254 according to the sensitivity (S_n) and specificity (S_p) statistics. S_n , also called the true
255 positive rate, measures the proportion of correct positives. S_p , also called the true
256 negative rate, measures the proportion of correct negatives (Altman & Bland, 1994).

257 **3. Results and Discussion**

258 *3.1. Olive Oil Spectrum*

259 Near-infrared spectra show various overlapping bands, because of the first and second
260 overtones and fundamental vibrations combinations, mainly carbon–hydrogen. Shenk,
261 Workman, & Westerhaus (2001), among others, assigned the major near-infrared
262 absorption bands of agricultural products, and on olive oil and other plant oils, it has

263 been done by Harwood & Aparicio (2000). Assigning the major visible absorption
264 bands of olive oil was made by Moyano, Meléndez, Alba, & Heredia (2008).

265 Olive oil spectra from the samples analyzed in this work, shown in Figure 1, agree with
266 the previous reports. A first minor peak occurs next to 415 nm. This area suits to the
267 wavelengths of oil absorption which are dark blue colored light. It could be due mainly
268 to carotenoids, as well to pheophytin a, pheophorbide a and pyropheophytin a (Moyano,
269 Meléndez, Alba, & Heredia, 2008). A second minor peak is near 450 nm, matching to
270 blue light absorption, characteristic of carotenoids (Moyano, Meléndez, Alba, &
271 Heredia, 2008). The wavelength suiting to absorption of pale yellow, the color of the
272 olive oil tocopherols, is at 610 nm where is a third minor peak, not described. A fourth
273 major peak appears around at 670 nm, which coincides with chlorophylls absorption.
274 There are bands of high intensity, related to the strong water absorption that exists from
275 its first overtone at 1400 to 1500 nm and a combination band at 1880–2100 nm. They
276 link with the first overtone of the C-H vibration of several chemical groups (–CH₃, –
277 CH₂). About the latter spectral band, should note the main triglyceride and the major
278 part of olive oil is triolein. The maximum absorption peak in the triolein spectrum is at
279 1725 nm (García, Baeten, Fernández, & Tena, 2013). This maximum absorption band is
280 characteristic of olive oils, as previously reported (García, Baeten, Fernández, & Tena,
281 2013, García, 2015). A broad absorbance band exists around 1220 nm, probably from
282 oil and due to second overtones of C–H and CH=CH– stretching vibrations. A high
283 intensity absorbance peak occurs about 2300 nm caused by a combination of
284 fundamental vibrations from the C-H groups (Hourant, Baeten, Morales, Meurens, &
285 Aparicio, 2000, Moyano, Meléndez, Alba, & Heredia, 2008).

286

Figure 1

287 3.2. Population Characterization

288 The ~~reference-statistical~~ analysis ~~results/statistics from of~~ the α , β , and γ -tocopherol ~~and~~
289 ~~total tocopherol contents for the~~ calibration and external validation sets ~~gathered are~~
290 ~~shown~~ in Table 1. ~~The same statistics arithmetically calculated (sum of α , β , and γ -~~
291 ~~tocopherols) are included for total tocopherols.~~ Olive oils from all commercial types
292 were analyzed. As shown, a wide tocopherols variation range integrates into the
293 validations and calibrations, this last ranging from 64.2 ppm to 1078.0 ppm for total
294 tocopherols. This range reflects the extent of the tocopherols variation in olive oil
295 depending on the produce. Pomace olive oils were included since they show the higher
296 content in tocopherols among the olive oil products. In fact, the total tocopherols
297 maximum in the present study was similar to that reported in pomace olive oil (Perona,
298 Arcemis, Ruíz, & Catalá, 2005). The α -tocopherol range in the current study (54.5-
299 755.9 ppm) was wider than reported previously by several authors. For example,
300 Cimato et al. (1991) reported α -tocopherol contents of 74 to 454 ppm depending on the
301 variety and region, while Sayago, Marín, Aparicio, & Morales (2007) pointed out
302 levels in olive from 93 to 354 ppm for the same compound. Similarly, total tocopherols
303 ranging from 100 to 420 ppm has been reported, depending mainly on variety and
304 harvest date (Uceda & Hermoso, 2001; Velasco & Dobarganes, 2002). The statistical
305 mean of α , γ , and β -tocopherols in the analyzed calibrations sets were 179.7, 17.8 and
306 2.4 ppm, while it was 209.0 ppm for total tocopherol.

307 Table 1

308 3.3. Spectral Variable Analysis

309 Many spectral variables did not contribute to the PLS models, since their removal
310 allowed improving calibrations. Uninformative spectral variables can provide false

311 contribution in the calibration models, leading to inappropriate PLS methods, thus
312 reducing their predictive reliability. Beebe & Kowalski (1987) showed this effect by
313 adding new columns of NIR wavelength data that had no useful information for
314 describing their protein and moisture PLS models. Therefore, spectral variable selection
315 is of major importance. The contributing wavelengths in this study were established by
316 the procedure previously described for removing uninformative spectral variables. The
317 spectral windows and single wavelengths from the Luminar spectrometer contributing
318 for the α -tocopherol model (M_1) are shown in the Figure 2. In these graphs,
319 wavelengths within the horizontal line have zero contribution to the model.

320 Figure 2

321 The iPLS method for selecting spectral variables did not operate better than the whole
322 spectrum when ~~elaborating-developing~~ the PLS-DA model, ~~according-based on~~ their
323 sensitivity and specificity statistical values.

324 *3.4. PCA Analysis*

325 The PCA analysis of olive oil spectra from both NIR and Vis/NIR showed the absence
326 of sample groups. No outliers were detected in either PCA analysis from spectra NIR
327 nor Vis/NIR. The PCA from 1100-2300 nm is shown in Figure 3a, where the PC1
328 explained 99% and the PC2 explained 1% of variability. It highlights ~~for-the appearing~~
329 appearance of several samples separated from the major group, ~~which agreeing-agrees~~
330 with the α -tocopherol values. ~~However,~~ ~~These~~ these values are not the cause for the
331 separation of these samples from the group. In fact, their α -tocopherol contents are
332 intermediate, as deduced from the statistical analysis results listed in Table 1. The same
333 applies to the other species of tocopherols. This segregation did not suit to a specific

334 cultivar, since there were different olive oil varieties among the separated samples (data
335 not shown). However, we checked that all samples with values higher ~~than~~ 0.025 for
336 PC2 in Figure 3a match to the EVOO class (data not shown).

337 The PCA from Vis/NIR spectra ~~obtained from~~ Labspec ~~equipment~~ is shown in Figure
338 3b, the PC1 explaining 76% and PC2 15% of variability. Several samples appear clearly
339 separated, this segregation differing from that shown in Figure 3a. These samples suit to
340 EVOO as in the PCA previously discussed, their α -tocopherol contents showing also
341 intermediate values. In this case, however, excepting one with α -tocopherol value 188.1
342 ppm, they are olive oils provided from the industry or extracted in the research center.
343 These samples have in common a fresh extraction, while the exception before signaled
344 is an EVOO sample also. Therefore, the tocopherols contents do not have any relation
345 with the segregation in this PCA analysis. From these results, we can assume that PCA
346 analysis is uninformative for classifying olive oils according ~~to~~ their tocopherols
347 content.

348 Figure 3

349 3.5. *Tocopherols PLS Quantitative Models*

350 The treatments mean normalization and second Savitzsky-Golay mostly provided the
351 best performance, with both optical configurations. Their statistics gather in Table 2.
352 There were exceptions in the calibrations for γ -tocopherol with 1100-2300 nm from the
353 NIR spectra, and in α - and β -tocopherols with the Vis/NIR spectra, for which the first
354 Savitzsky-Golay derivative treatment fitted better.

355 Some lampante and pomace olive oils showed significant differences between their
356 ~~values~~ analyzed and predicted ~~values~~ when calibrating for α -tocopherol with NIRS and

357 Vis/NIRS. As mentioned previously, the purpose for using these olive oils types was to
358 improve the robustness of the calibrations. Those samples showing relation of predicted
359 to analyzed values higher to 2, as well as the same for the inverse, were separated in
360 these calibrations only from such classes. The same happened for the NIRS and
361 Vis/NIRS calibrations of total tocopherols, since α -tocopherol is the major in them,
362 applying the same treatment. On the contrary, in the β -tocopherol and γ -tocopherol
363 calibrations, some EVOO samples showed bad fit while the fact before described with
364 lampante and pomace olives oils did not occurs. This probably is because of the higher
365 β -tocopherol and γ -tocopherol values in some pomace and lampante samples, which we
366 did check. These facts explained the different sizes of the calibration sets for both
367 optical modes and types of tocopherols shown in Table 2.

368 Table 2

369 The NIRS model for α -tocopherol (M_1) provided $R = 0.95$, $R_{CV} = 0.94$ and $SEC =$
370 36.14 . The calibration statistics from the model for α -tocopherol held with Vis/NIR
371 provided $R = 0.94$, $R_{CV} = 0.92$ and $SEC = 33.90$.

372 On total tocopherols, the model from NIRS (M_2) yields $R = 0.92$, $R_{CV} = 0.88$ and $SEC =$
373 57.15 . Besides, the statistics from the Vis/NIR were $R = 0.91$, $R_{CV} = 0.89$ and $SEC =$
374 43.83 .

375 The general mathematical equation of M_1 and M_2 models are [2]:

$$376 \quad Y_p = B_0 + \sum (B_{\lambda i} \cdot X_{\lambda i}) \quad [2]$$

377 Where

378 Y_p = values predicted of α -tocopherol or total tocopherols respectively in M_1 and M_2
379 (ppm).

380 $B_0 = B_0$ coefficient.

381 B_{λ_i} = Coefficient of math treated spectrum for each contributing wavelength.

382 X_{λ_i} = Absorbance of the sample for each contributing wavelength ($\text{cm}^{-1} \text{mol}^{-1} \text{nm}^{-2}$).

383 The B_0 and B_{λ_i} values are given by the software.

384 The Figure 4 represents the multivariate regressions for α -tocopherol (*a*) and total
385 tocopherols (*b*).

386 | According to the data above, both optical configurations showed similar calibration
387 | fitness, with small differences in their statistics. Therefore it is reasonable to expect
388 | similar working from both.

389 | Figure 4

390 | 3.6. External Validation Exercises

391 | The statisticalals results obtained from the external validations tests by-to predicting
392 | α -, γ -, β - and total- tocopherols on the reserved set of 107 samples reserved are shown
393 | in Table 3. As these statisticalals results have shown, the models with the transfectance
394 | optical configuration from-with NIR wavelengths -NIR-only, performed better than the
395 | Vis/NIR transmittance model. This fact happened for α , γ and total tocopherols. For β -
396 | tocopherols, both configurations provided low performance, Vis/NIRS showing $r = 0.41$
397 | versus $r = 0.26$ with NIR. It is reasonable to think this last is because β -tocopherol is a
398 | minor compound in olive oil.

399 The validation using M_1 model (V_1) for α -tocopherol is plotted in Figure 5a. The
400 model performance is defined by the r value 0.91 and $RPD = 2.37$ from this external
401 validation exercise. The NIRS model for total tocopherols was tested for predicting the
402 validation set (V_2). This external validation, depicted in Figure 5b, gave $r = 0.90$ and
403 $RPD = 2.01$.

404 According to several authors (Williams, 2014; Esbensen, Geladi, & Larsen, 2014), RPD
405 interpretation must consider the material analyzed. There is general agreement that
406 models with RPD higher to 10 are excellent (Fearn, 2002, Williams, 2014, Fearn, 2015,
407 Esbensen, Geladi, & Larsen, 2014). RPD between 5 and 10 holds high accuracy and
408 aptness for analysis analogous to that of the reference methods. Those with values
409 between 2 and 5 offer the accuracy wanted for providing good estimations (Williams,
410 2014). Other authors consider good RPD greater than two (Barlocco et al., 2006). One
411 Should note RPD is essentially the same statistic r (Fearn, 2002; Minasny &
412 McBratney, 2013). The prediction exercise for α -tocopherol, V_1 (Figure 8), provided $r =$
413 0.91 and $RPD = 2.37$, while for total tocopherols V_2 (Figure 9) gave $r = 0.90$ and $RPD =$
414 2.00 . These statistics prove that referred models are useful for estimating α - and total
415 tocopherols in olive oils.

416

417 Table 3

418 Figure 5

419 3.7. *Sorting Tests*

420 The olive oil α -tocopherol content was classified by using the M_1 PLS model on the
421 validation set previously reserved. This classification was according to the classes High

422 α -Tocopherol (H α T), with α -tocopherol higher to 200 ppm, and Low α -Tocopherol
423 (L α T), lower or equal to 200 ppm. The result ~~it~~ was 91 samples correctly sorted out of
424 the 104 samples and a success of 99.9%. This procedure has been registered in the
425 Spanish Patent and Trademark Office as the patent P201531729, ~~currently in priority~~
426 ~~year~~. The sorting test results ~~and for~~ predicted and reference values of α -tocopherol are
427 in the Appendix.

428 The iPLS method did select four spectral windows for the PLS-DA model, which gave
429 the best calibration statistics, shown in Table 4. We must note in the case of PLS-DA
430 models there is not a simple regression vector to use, as in PLS. The sorting test two
431 olive oil classes according to α -tocopherol, by using this PLS-DA model with threshold
432 at 200 ppm, gave $S_n = 0.85$ and $S_p = 0.96$. The results from the validation exercises
433 carried out with PLS-DA models both from the whole spectrum and from the iPLS
434 variable selection, are gathered in Table 4. One can notice in these data, based on the
435 statistical analysis results, that these models perform better ~~Can note in these data the~~
436 ~~statistics points out a better working~~ when using the whole spectrum. Therefore, the
437 validation exercises ~~did~~ not prove ~~the seeming~~ a considerable improvement by iPLS
438 method. The PLS-DA method for distinguishing the proposed classes of olive oils
439 according to their α -tocopherol content was successful. PLS-DA achievement is
440 similar, although, it is in whole overall slightly lower than that from PLS. PLS yields a
441 continuous quantitative variable ~~continuous~~, which we use to set a discrete variable of
442 two classes, while PLS-DA classifies using directly this discrete class variable. Thus,
443 comparing results from PLS-DA ~~against with~~ PLS quantitative classification is difficult.
444 Should note that more reference information involves in the quantitative PLS model
445 than in PLS-DA, this last built directly from the discrete variable. Therefore, PLS

446 supplies more information, implying that PLS can provide greater accuracy and
447 robustness. The results of this study agree with that.

448 Table 4

449 **4. Conclusions**

450 The models using only NIR wavelengths predicted better the total tocopherols, α -
451 tocopherol and γ -tocopherol than that using wavelengths from the visible spectrum.
452 Predicting α -tocopherol with the NIRS model provided a valid estimate of the Vit E in
453 the olive oils. The validation exercises of sorting olive oils according to α -tocopherol
454 by the quantitative PLS model affords success higher to 99%. The same purpose carried
455 out by PLS-DA yields similar, although slightly lower. The data proves the feasibility of
456 estimating the olive oil α -tocopherol or total tocopherols contents by using NIRS. It
457 may provide useful information on product labeling. At the same time, these rapid
458 techniques can be helpful in the industry for sorting olive oils according to their Vit E.
459 The use of these techniques needs a suitable software, and calibrating for a specific
460 spectrometer. As well, it requires a procedure for periodic validation.

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465 **Bibliography**

466 Altman, D.G., & Bland, J.M. (1994). Diagnostic tests. 1: Sensitivity and specificity.
467 *British Medical Journal*, 308, 1552.

468 Ayerdi-Gotor, A., Farkas, E., Berger, M., Labalette, F., Centis, S., Daydé, J., Calmon,
469 A. (2007). Determination of tocopherols and phytosterols in sunflower seeds by NIR
470 spectrometry. *European Journal of Lipid Science and Technology*, 109, 525-530.

471 Barlocco, N., Vadell, A., Ballesteros, F., Galietta, G., Cozzolino, D., 2006. Predicting
472 intramuscular fat, moisture and Warner-Bratzler shear force in pork muscle using near
473 infrared reflectance spectroscopy. *Animal Science*, 82, 111-116.

474 Beebe, K.R., & Kowalski, B.R. (1987). An introduction to multivariate calibration and
475 analysis. *Analytical Chemistry*, 59, 1007A-1017A.

476 Beltrán, G., Jiménez, A., Del Rio, C., Sánchez, S., Martínez, L., Uceda, M., &
477 Aguilera, M.P. (2010). Variability of Vit E in virgin olive oil by agronomical and
478 genetic factors. *Journal of Food Composition Analysis*, 23, 633-639.

479 Bendini, A., Cerretani, L., Di Virgilio, F., Belloni, P., Lercker, G., & Gallina-Toschi, T.
480 (2007). In-process monitoring in industrial olive mill by means of FT-NIR. *European*
481 *Journal of Lipid Science and Technology*, 109, 498–504.

482 Budavari, S. Ed. The Merck Index. An encyclopedia of chemical, drugs and biologicals.
483 11th ed. Merck & CO., Inc. Rahway, 1989.

484 Cimato, A., Moldi, G., Mattei, A., Niccolai, M., & Alessandri, S. (1991). La
485 caratterizzazione dell'olio extravergine. Consorzio Regionale Olivo extra vergine di
486 oliva 'Tipico Toscano', pp 1-77. Montepulciano, Italy.

487 Conte, L.S., Brussolo, G., Pizzale, L., Carazzolo, A., Meurens, M., & Pavan, O. (2003).
488 Application of near infrared reflectance analysis to olive oil production quality control.
489 *Rivista Italiana delle Sostanze Grasse*, 80, 213–217.

490 Costa, A.F., Coelho, M.J., Gambarra, F.F., Bezerra, S.R., Harrop, R.K., & Ugulino,
491 M.C. (2008). NIR spectrometric determination of quality parameters in vegetable oils
492 using PLS and variable selection. *Food Research International*, 41, 341–348.

493 Deiana, M., Rosa, A., Cao, C.F., Pirisi, F.M., Bandino, G., & Dessi, M.A. (2002). Novel
494 approach to study oxidative stability of extra virgin olive oils: Importance of alpha-
495 tocopherol concentration. *Journal of Agricultural and Food Chemistry*, 50, 4342–4346.

496 Dutta, A., & Dutta, S.K. (2003). Vit E and its role in the prevention of atherosclerosis
497 and carcinogenesis: a review. *Journal of the American College of Nutrition*, 22, 258-
498 268.

499 European Food Safety Authority. (2015). Scientific Opinion on Dietary Reference
500 Values for Vit E as α -tocopherol. *European Food Safety Authority Journal*, 13, 4149.

501 European Union. Regulation (EU) No 1169/2011 of the European Parliament and of
502 the Council of 25 October 2011 on the provision of food information to
503 consumers. *Official Journal of the European Union*, November 22, 2011.

504 Esbensen, K.H., Geladi, P., & Larsen, A. (2014). The RPD myth. *NIR News*, 25(5), 24.

505 Fearn, T. (2002). Assessing calibration: SEP, RPD, RER and R^2 . *NIR News*, 13(6), 12-
506 14.

507 Fearn, T. (2015). The Library of Babel (validation). *NIR News*, 26(8), 23.

508 García, D.L., Baeten, V., Fernández, J.A., & Tena, N. (2013). Infrared, Raman, and
509 fluorescence spectroscopies: Methodologies and applications. In R. Aparicio, & J.
510 Harwood (Eds.), *Handbook of olive oil: Analysis and properties* (pp. 335-393). New
511 York: Springer.

512 García, J.F. (2015). Optical path length and wavelength selection using VisNIR
513 spectroscopy for olive oil free acidity determination. *International Journal of Food*
514 *Science and Technology*, 50, 1461–1467.

515 González-Martín, I., Hernández-Hierro, J.M., Bustamante-Rangel, M., Barros-Ferreiro,
516 N. (2006a). Near-infrared spectroscopy (NIRS) reflectance technology for the
517 determination of tocopherols in alfalfa. *Analytical and Bioanalytical Chemistry*, 386,
518 1553–1558.

519 González-Martín, I., González-Cabrera, J.M., Bustamante-Rangel, M., Delgado-
520 Zamarreño, M.M. (2006b). Near infrared spectroscopy (NIRS) reflectance technology
521 for determination of tocopherols in animal feeds. *Analytica Chimica Acta*, 558, 132–
522 136.

523 Harwood, J., & Aparicio, R. (2000). *Handbook of Olive Oil: Analysis and Properties*,
524 Gaithersburg: Aspen Publishers (Chapter 10).

525 Hourant, P., Baeten, V., Morales, M.T., Meurens, M., & Aparicio, R. (2000). Oil and fat
526 classification by selected bands of near-infrared spectroscopy. *Applied Spectroscopy*,
527 54, 1168–1174.

528 ISO. Standard 9936. Animal and vegetable fats and oils. Determination of tocopherol
529 and tocotrienol contents by high-performance liquid chromatography. Geneva, 2016.

530 Jiang, H.Y., Xie, L.J., Peng, Y.S., Yin, Y.B. (2008). Study on the influence of
531 temperature on near infrared spectra. *Guang Pu Xue Yu Guang Pu Fen Xi*, 28(7), 1510-
532 1513.

533 Jiang, Q., Christen, S., Shigenaga, M.K., & Ames, B.N. (2001). Gamma-tocopherol, the
534 major form of Vit E in the US diet, deserves more attention. *American Journal of*
535 *Clinical Nutrition*, 74, 714–722.

536 Jessup, J.V., Horne, C., Yarandi, H., & Quindry, J. (2003). The effects of endurance
537 exercise and Vit E on oxidative stress in the elderly. *Biological Research for Nursery*, 5,
538 47–55.

539 Yong-Ho, K. (2004). Quantification of Tocopherol and Tocotrienol Content in Rice
540 Bran by Near Infrared Reflectance Spectroscopy. *Korean Journal of Crop Science*, 49,
541 211-215.

542 Lodge, J.K., Traber, M.G., Elsner, A., & Brigelius-Flohé, R. (2000). A rapid method for
543 the extraction and determination of Vit E metabolites in human urine. *Journal of Lipid*
544 *Research*, 41, 148–154.

545 Mailer, R.J. (2004). Rapid evaluation of olive oil quality by NIR reflectance
546 spectroscopy. *Journal of the American Oil Chemists Society*, 81, 823–827.

547 Martínez, J.M., Muñoz, E., Alba, J., Lanzón, A. (1975). Report on the use of the
548 Abencor olive oil yields analyser. *Grasas y Aceites* 26, 379-385.

549 Minasny, B., McBratney, A. (2013). Why you don't need to use RPD. *Pedometron* 33,
550 14-15.

551 Moyano, M.J., Meléndez, A.J., Alba, J., & Heredia, F.J. (2008). A comprehensive study
552 on the colour of virgin olive oils and its relationship with their chlorophylls and
553 carotenoids indexes (I): CIEXYZ non-uniform colour space. *Food Research*
554 *International*, 41, 505–512.

555 Office of Disease Prevention and Health Promotion of the U.S.A. Dietary Guidelines.
556 (2016). <http://health.gov/dietaryguidelines/2015/guidelines/> Accessed 02/26/2016.

557 Perona, J.S., Arcemis, C., Ruíz, V., Catalá, A. (2005). Effect of Dietary High-Oleic-
558 Acid Oils that are Rich in Antioxidants on Microsomal Lipid Peroxidation in Rats.
559 *Journal of Agricultural and Food Chemistry*, 53, 730-735.

560 Sayago, A., Marín, M.I., Aparicio, R., & Morales, M.T. (2007). Vitamina E y aceites
561 vegetales. *Grasas y Aceites*, 58(1), 74-86.

562 Shaidi, F. (2004). Functional foods: Their role in health promotion and disease
563 prevention. *Journal of Food Science*, 69, 146–149.

564 Shenk, J.S., Workman, J.J., & Westerhaus, M.O. (2001). Application of NIR
565 spectroscopy to agricultural products. In D. A. Burns, & C. W. Ciurcak (Eds.),
566 *Handbook of Near Infrared Analysis* (pp. 419-474). New York: Marcel Dekker.

567 Souci, S.W., Fachmann, W., & Kraut, H. (1994). *Food Composition and Nutrition*
568 *Tables*. (5th edition), Medpharm Scientific Publishers: Boca Raton: CRC Press. (Olive
569 oil).

570 Szłyk, E., Szydłowska-Czerniak, A., Kowalczyk-Marzec, A. (2005). NIR spectroscopy
571 and partial least-squares regression for determination of natural alpha-tocopherol in
572 vegetable oils. *Journal of Agricultural and Food Chemistry*, 53(18), 6980-6987.

573 Uceda, M., & Hermoso, M. (2001). La calidad del aceite de olive. In D. Barranco, R.
574 Fernández-Escobar, & L. Rallo (Eds.), *El cultivo del olivo* (pp. 589-614). 4th edition.
575 Madrid: Mundi-Prensa.

576 United States Department of Agriculture (USDA). National Nutrient Database for
577 Standard Reference: Vit E (alphatocopherol) content of selected foods per common
578 measure. (2016). www.nal.usda.gov/fnic/foodcomp/search. Accessed 03/01/2016.

579 Velasco, J., & Dobarganes, M.C. (2002). Oxidative stability of virgin olive oil.
580 *European Journal of Lipid Science & Technology*, 104, 661–676.

581 Wagner, K.H., Kamal-Eldin, A., & Elmadfa, I. (2004). Gamma-tocopherol. An
582 underestimated Vit?. *Annals of Nutrition & Metabolism*, 48, 169–188.

583 Williams, P., & Sobering, D. 1996. How do we do it: a brief summary of the methods
584 we use in developing near infrared calibrations’, in Davies, A.M.C. and Williams, P.
585 (Eds.): *Near Infrared Spectroscopy: The Future Waves*, pp.185–188, NIR Publications,
586 Chichester, UK.

587 Williams, P. (2014). The RPD statistic: a tutorial note. *NIR News*, 25(1), 22.

588 Wiseman, S. A., Tijburg, L.B., & Van de Put, F.H. (2002). Olive oil phenolics protect
589 LDL damage and spare Vit E in the hamster. *Lipids*, 37, 1053–1057.

590

Figure 1

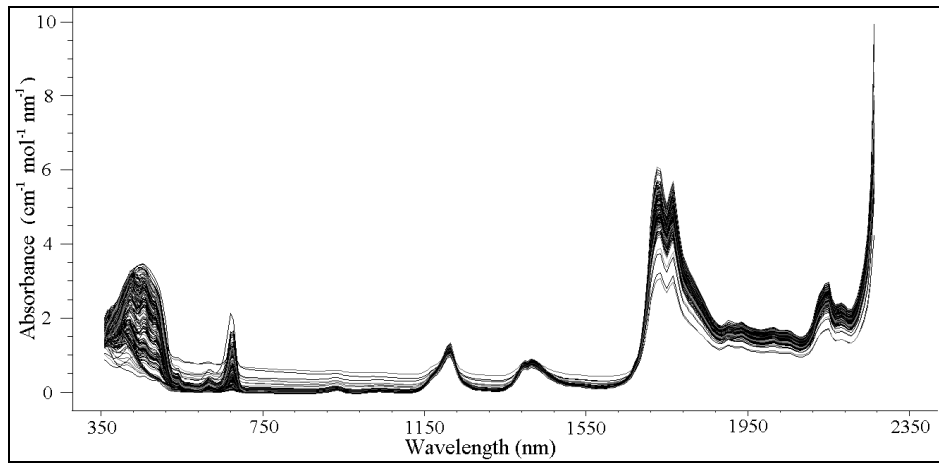


Figure 2

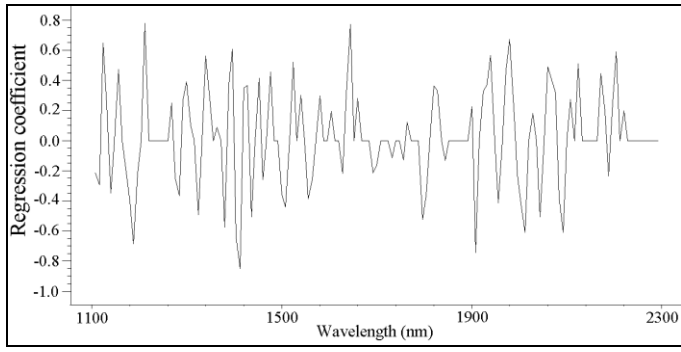


Figure 3

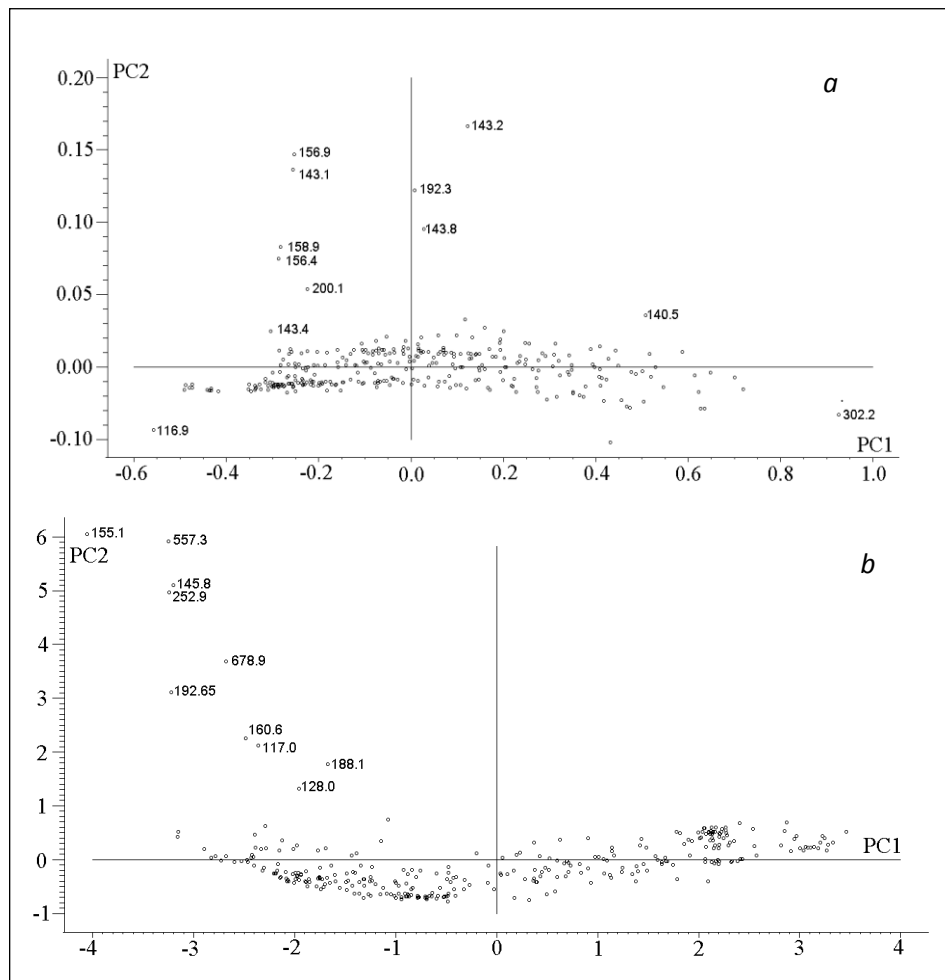


Figure 4

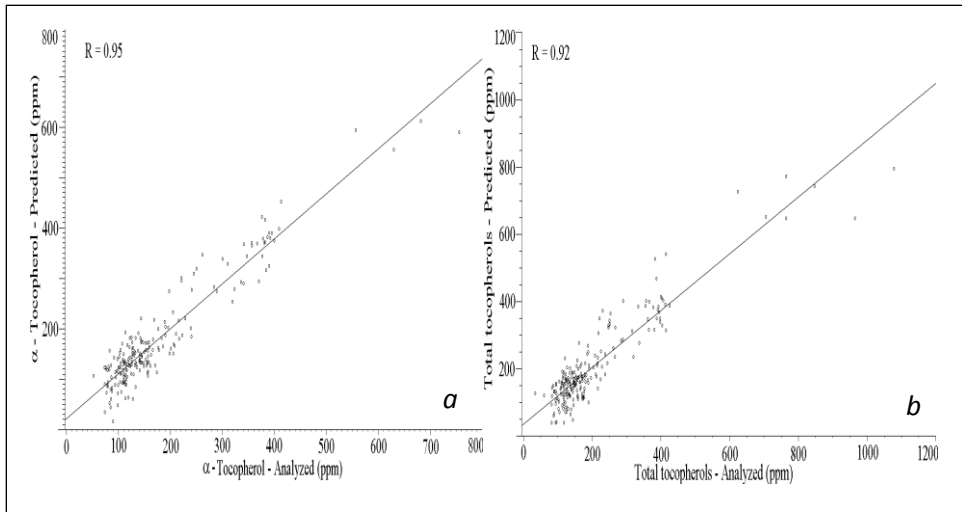


Figure 5

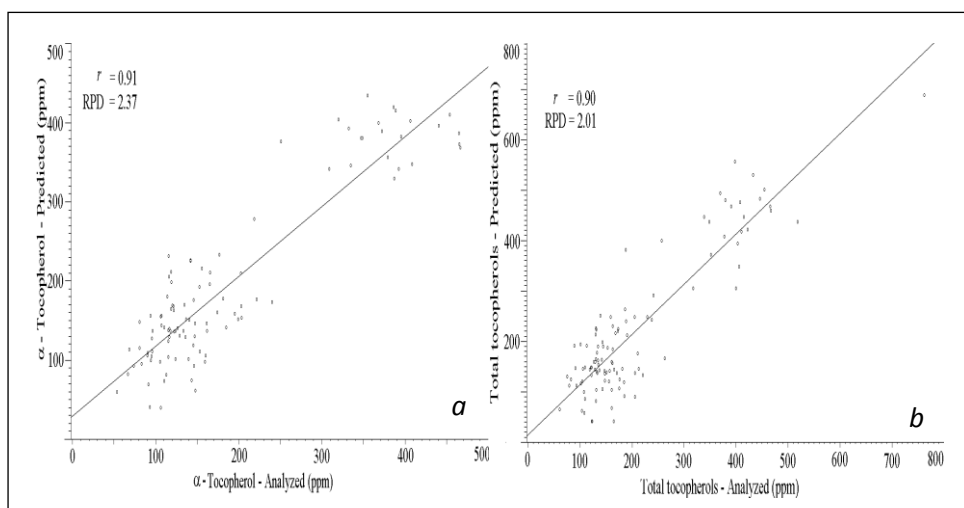


Table 1. Statistics of the tocopherols contents (ppm) in the calibration and external validation sets.

Tocopherols	<i>Calibration</i>			<i>Validation</i>		
	\bar{x}	σ	Range	\bar{x}	σ	Range
Total	209.0	142.6	64.2 - 1078.0	209.5	124.3	63.1 - 762.3
α	179.7	111.8	54.5 - 755.9	187.9	111.9	55.2 - 466.4
β	2.4	1.7	0.7 - 14.1	2.4	1.4	0.5 - 10.0
γ	17.8	13.4	2.5 - 103.8	17.7	12.1	1.8 - 73.4

α , α -tocopherol; β , β -tocopherol; γ , γ -tocopherol (α , β , and γ -tocopherols, HPLC analyzed).
Total, Total tocopherols (arithmetically calculated by sum of α , β , and γ -tocopherols).

Table 2. Statistics of PLS quantitative models.

	Total Tocopherols		α-tocopherol		γ-tocopherol		β-tocopherol	
	NIR	Vis/NIR	NIR	Vis/NIR	NIR	Vis/NIR	NIR	Vis/NIR
N	213	197	206	189	211	195	211	197
Tr.	D2SG	D2SG	D2SG	D1SG	D1SG	D2SG	D2SG	D1SG
PLS _f	15	5	15	9	14	10	10	10
R	0.92	0.91	0.95	0.94	0.92	0.87	0.64	0.66
R _{CV}	0.88	0.89	0.91	0.92	0.88	0.85	0.52	0.54
SEC	57.15	43.83	36.14	33.90	5.34	4.54	0.58	0.59

PLS, Partial Least Squares; N, samples number; Tr., treatment; PLS_f, PLS factors; R, calibration coefficient; R_{CV}, calibration coefficient from the internal cross validation; SEC, standard error of calibration. NIR, spectra acquired with Luminar (1100-2300 nm); Vis/NIR, spectra acquired with Labspec (350-2500 nm); D2SG, Savitzsky-Golay second derivative; D1SG, Savitzsky-Golay first derivative.

Table 3. Statistics of predicting exercises with PLS quantitative models.

	<i>Total Tocopherols</i>		<i>α-tocopherol</i>		<i>γ-tocopherol</i>		<i>β-tocopherol</i>	
	NIR	Vis/NIR	NIR	Vis/NIR	NIR	Vis/NIR	NIR	Vis/NIR
N	107	91	104	93	106	101	108	102
<i>r</i>	0.90	0.80	0.91	0.86	0.88	0.75	0.26	0.41
SEP	61.84	76.26	47.21	58.28	6.33	8.12	1.35	1.32
RPD	2.01	1.63	2.37	1.92	1.91	1.49	1.04	1.06

PLS, Partial Least Squares; N, samples number; *r*, regression coefficient between the predicted and reference values; SEP, standard error of prediction; RPD, residual predictive deviation; NIR, spectra acquired with Luminar (1100-2300 nm); Vis/NIR, spectra acquired with Labspec (350-2500 nm).

Table 4. PLS-DA for α -tocopherol from NIR spectra.

	<i>Calibration</i>				<i>Validation</i>				
	N = 218				N = 109				
	<i>HαT</i>	<i>LαT</i>	<i>HαT</i>	<i>LαT</i>	<i>HαT</i>	<i>LαT</i>	<i>HαT</i>	<i>LαT</i>	
	Spectrum whole		iPLS variables⁽¹⁾		Spectrum whole		iPLS variables⁽¹⁾		
S_{n-Cal}	0.85	0.96	0.86	0.95	S_{n-Pred}	0.84	0.96	0.84	0.94
S_{p-Cal}	0.96	0.85	0.95	0.86	S_{p-Pred}	0.96	0.84	0.94	0.84
S_{n-CV}	0.85	0.95	0.86	0.95					
S_{p-CV}	0.95	0.85	0.95	0.86					

PLS-DA, Partial Least Squares Discriminant Analysis; *H α T*, high α -tocopherol; *L α T*, low α -tocopherol. iPLS, interval Partial Least Squares; S_{n-Cal} , calibration sensitivity; S_{p-Cal} , calibration specificity; S_{n-CV} , sensitivity in the cross validation; S_{p-CV} , specificity in the cross validation; S_{n-Pred} , prediction sensitivity; S_{p-Pred} , prediction specificity. ⁽¹⁾ iPLS variables: 1302-1342 nm; 1390-1422 nm; 1830-1862 nm; 2030-2062 nm.

Note: The PLS-DA classification can be represented as a PLS predicting between class A and B, by using $y = 0$ or $y = 1$. The threshold value where y predict greater than or less than the same, it determines to which class a sample belongs to:

$$\text{Probability that a sample is class 1} = \frac{P(y,1)}{(P(y,1)+P(y,0))}$$

where y is the y value predicted from the PLS-DA model for the sample in question, $P(y,1)$ is the probability of measuring the given y value for a class 1 sample and $P(y,0)$ is the probability of measuring the y value for a class 0 sample. The two probabilities used above ($P(y,1)$, $P(y,0)$) are estimated from the y -values observed in the calibration data.

Figure Captions

Figure 1 - Olive oil Vis/NIR spectra from all samples analyzed.

Figure 2 - Spectral variables contributing to the α -tocopherol NIRS model (M_1).

Figure 3 – PCA from olive oils spectra *a*) 1100-2300 nm. ; *b*) 350-2500 nm. α -tocopherol (ppm).

Figure 4 - PLS models *a*) α -tocopherol (M_1); *b*) Total tocopherols (M_2).

Figure 5 - Prediction exercises *a*) α -tocopherol (V_1); *b*) Total tocopherols (V_2).

Sample	Com. Class	Predicted	Reference	Success	Sample	Com. Class	Predicted	Reference	Success
1	EVOO-Com.	178.06	182.28	*	53	EVOO-Com.	97.69	106.85	*
2	EVOO-Com.	209.83	203.60	*	54	EVOO-Com.	39.37	107.68	*
3	EVOO-Com.	232.84	177.54		55	EVOO-Com.	40.50	94.41	*
4	EVOO-Com.	176.70	222.43		56	EVOO-Com.	108.78	91.97	*
5	EVOO-Com.	158.90	196.05	*	57	EVOO-Com.	60.00	55.21	*
6	EVOO-Com.	159.98	175.16	*	58	EVOO-Com.	82.09	68.24	*
7	EVOO-Com.	141.16	185.89	*	59	EVOO-Com.	92.55	75.16	*
8	EVOO-Com.	140.81	111.61	*	60	OO-Com.	211.54	120.00	
9	EVOO-Com.	231.50	116.96		61	OO-Com.	164.76	119.72	*
10	EVOO-Com.	170.19	135.92	*	62	OO-Com.	136.50	119.06	*
11	EVOO-Com.	210.55	166.77		63	OO-Com.	169.23	121.55	*
12	Lamp.-Ind.	130.28	148.30	*	64	OO-Com.	61.30	149.12	*
13	Lamp.-Ind.	136.50	162.89	*	65	OO-Com.	110.94	97.18	*
14	Lamp.-Ind.	97.49	160.52	*	66	OO-Com.	73.66	111.65	*
15	Lamp.-Ind.	162.68	123.11	*	67	OO-Com.	95.45	84.72	*
16	Lamp.-Ind.	139.15	117.76	*	68	OO-Com.	205.08	117.42	
17	Lamp.-Ind.	128.84	136.89	*	69	OO-Com.	127.05	96.79	*
18	Lamp.-Ind.	136.42	123.39	*	70	OO-Com.	124.06	116.71	*
19	Lamp.-Ind.	173.68	241.04		71	OO-Com.	113.88	69.68	*
20	Lamp.-Ind.	278.16	219.58	*	72	OO-Com.	144.07	108.46	*
21	OO-Com.	168.37	204.14		73	POO-Com.	346.01	335.07	*
22	OO-Com.	115.44	82.00	*	74	POO-Com.	403.76	320.42	*
23	OO-Com.	74.50	144.60	*	75	POO-Com.	375.95	251.43	*
24	OO-Com.	92.41	147.34	*	76	POO-Com.	400.16	368.52	*
25	OO-Com.	118.78	146.56	*	77	POO-Com.	329.63	387.37	*
26	OO-Com.	148.47	82.24	*	78	POO-Com.	341.90	392.60	*
27	OO-Com.	105.22	96.62	*	79	POO-Com.	382.61	395.72	*
28	OO-Com.	129.14	117.97	*	80	POO-Com.	415.17	389.16	*
29	OO-Com.	136.58	125.34	*	81	POO-Com.	341.62	309.31	*
30	OO-Com.	176.28	147.01	*	82	EVOO-R.P.	356.22	379.60	*
31	OO-Com.	136.71	134.45	*	83	EVOO-R.P.	392.87	333.00	*
32	OO-Com.	130.78	130.20	*	84	EVOO-R.P.	368.48	466.40	*
33	OO-Com.	140.61	127.82	*	85	EVOO-R.P.	396.30	440.70	*
34	OO-Com.	146.71	148.38	*	86	EVOO-R.P.	402.21	406.50	*
35	EVOO-Com.	111.01	154.41	*	87	EVOO-R.P.	347.94	408.60	*
36	EVOO-Com.	155.82	108.36	*	88	EVOO-R.P.	434.57	355.50	*
37	EVOO-Com.	101.54	140.74	*	89	EVOO-R.P.	387.07	465.00	*
38	EVOO-Com.	104.06	116.38	*	90	EVOO-R.P.	372.48	465.30	*
39	EVOO-Com.	106.08	91.64	*	91	EVOO-R.P.	389.44	372.50	*
40	EVOO-Com.	154.96	107.72	*	92	EVOO-R.P.	410.46	453.90	*
41	EVOO-Com.	150.62	141.78	*	93	EVOO-R.P.	419.33	386.60	*
42	EVOO-Com.	192.42	153.95	*	94	EVOO-R.P.	380.58	347.60	*
43	EVOO-Com.	226.64	143.22		95	EVOO-R.P.	381.06	349.30	*
44	EVOO-Com.	151.92	200.12		96	VOO-Ind.	195.72	166.30	*
45	EVOO-Com.	153.47	204.50		97	VOO-Ind.	146.74	162.72	*
46	EVOO-Com.	215.50	156.86		98	VOO-Ind.	151.62	137.75	*
47	EVOO-Com.	225.43	143.39		99	VOO-Ind.	180.04	115.30	*
48	EVOO-Com.	81.19	114.21	*	100	VOO-Ind.	155.90	95.41	*
49	EVOO-Com.	137.00	97.84	*	101	VOO-Ind.	167.82	122.87	*
50	EVOO-Com.	99.55	95.83	*	102	VOO-Ind.	101.46	125.06	*
51	EVOO-Com.	69.35	92.83	*	103	VOO-Ind.	137.82	116.45	*
52	EVOO-Com.	198.85	120.29	*	104	VOO-Ind.	105.70	161.13	*

Appendix. Sorting test using PLS model M₁.

Predicted and reference values of α -tocopherol, ppm; EVOO-Com., extra virgin olive oil commercial; Lamp.-Ind., lampante olive oil industrial; OO-Com., current olive oil commercial; POO-Com., pomace olive oil commercial; EVOO-R.P., extra virgin olive oil from research project; VOO-Ind., virgin olive oil industrial; Success (*), coincidence in sorting the olive oil as high or low in α -tocopherol. It is considered high α -tocopherol for contents greater than 200 ppm and low-tocopherol for less or equal to this value.