



Research Article

Application of chemometrics in combination with Fourier Transform Mid Infrared spectroscopy for authentication of avocado oil

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ARTICLE INFO

Received 20/02/2015
 Received in revised form
 05/03/2015
 Accepted 25/03/2015
 Available online 01/4/2015

ABSTRACT

This recent study was carried out to develop a rapid, simple, and accurate analytical method for authenticity determination of avocado oil (AO). Fourier transform-mid infrared (FT-MIR) spectroscopy technique aided with Partial Least Square (PLS) were optimized for that purpose to binary mixtures of AO with grapeseed oil (GO) and sesame oil (SeO). The calibration models were constructed at following selected MIR region with normal spectra treatment at combination 1006-902; 1191-1091; and 1755-1654 cm^{-1} (GO in binary mixture with AO) and 4000-650 cm^{-1} for analysis of SeO in binary mixture with AO. The high value of coefficient of determination (R^2) of 0.9994 with low root mean square error of calibration (RMSEC) value of 0.86 %v/v was revealed in GO quantification. Meanwhile, R^2 of 0.9997 with RMSEC 0.73 %v/v were obtained for analysis of SeO in binary with AO. The given value of root mean square error of prediction (RMSEP) during model validation were 0.52 %v/v (GO) and 0.53 %v/v (SeO), respectively. The high value of R^2 and low value of RMSEC and RMSEP during calibration and validation were associated with the accuracy and precision of the used method.

Keywords: avocado oil, FT-MIR spectroscopy, authentication, partial least square.

1. Introduction

Avocado belongs to the member of Lauraceae family having commercially important in the industry of fats and oils (Litz *et al*, 2007). Avocado is one of the valuable fruits due to the rich contents of nutrients such as proteins and dietary fibers. Moreover, avocado fruit contains some components, namely fat especially monosaturated fatty acid, water, protein, essential minerals and some lipid soluble vitamins, mainly vitamin A and vitamin E (Ozdemir and Topuz, 2004; Prasetyowati, 2010). The avocado fruit is oval with green to purple color, depending to the cultivar. The seed was round with brownish color, with 2.5-5 cm in diameter.

The pulp is yellow and buttery with good smell and taste (Steenis, 2002). The oil content of its pulp is about 8-30% depending on the cultivar and the origin (Takenaga *et al*, 2008).

Avocado oil (AO) belongs to the edible oil which is used widely for cooking oil, flavor additive in meal, and ingredient in cosmetics formulation as the emollient. Besides, AO has good benefit for human health due to the antioxidants and phytosterols components present in it (Roquejo *et al*, 2003). Those contribute in anticancer, hepatoprotective, and antioxidant activities (Berger *et al*, 2004). These beneficial effects led to the high price of AO in the oil and fat market. Since the price

of AO is estimated to 10-15 times higher than that of other vegetable oil, AO can be a target of adulteration with the cheaper vegetable oils in order to gain more economical profit.

The authenticity determination of high price oils is an interesting issue related to the consumer health and financial aspects. It becomes more serious when non halal matter such as lard is added in edible fats and oils (Rohman, and Che Man, 2012). The adulteration using adulterants which have similar chemical composition with that of target oil increases the difficulty of detection (Aparicio *et al*, 2007). Several analytical methods have been developed and employed for the detection and quantification of such adulterants. Most of these are based upon the separation of the components such as gas and liquid chromatography. The other analytical methods reported for authenticity study include nuclear magnetic resonance (Sacchi *et al*, 1997), Differential Scanning Calorimetry (Marina *et al*, 2009), electronic nose (Marina *et al*, 2010), and polymerase chain reaction (Aida *et al*, 2007). Those methods are too laborious, time consuming, expensive, and require the complex preparation of the samples. Besides, the hazardous chemical wastes are emitted during and after preparation (Quinone-Islas *et al*, 2013). Therefore, rapid, simple, and accurate must be developed in the oil authentication analysis.

Fourier transform infrared spectroscopy using attenuated total reflectance (FTIR-ATR) can be taken into account as method of choice for the authentication purpose due to its sensitivity, simplicity and rapidity (Rohman and Che Man, 2009). This method makes possible to use the small quantity of sample, minimal or no sample preparation is required prior to analysis, and can be applied to any physical state (solid, gels, liquid even gas) of samples. This technique is also claimed as green analytical method since there is no requirement of using hazardous solvent and no chemical waste released into the environment (Nurrulhidayah *et al*, 2011). The combination of FTIR-ATR with multivariate analysis allows someone to obtain specific information either qualitative or quantitative about different parameters simultaneously in a direct, reliable, and rapid way (Gallardo-Vellazquez *et al*, 2009).

The combination of FTIR spectroscopy and multivariate calibration of partial least square (PLS) calibration has been successfully employed for the detection and quantification of adulterants in certain oils such as olive oil adulterated with palm oil (Rohman and Che Man, 2010), black cumin oil adulterated with grape seed oil, corn oil and soybean oil (Nurrulhidayah *et al*, 2011; Rohman and Ariani, 2013), red fruit adulterated with soybean and corn oil (Setyaningrum *et al*, 2013), and authentication of extra virgin oil from some plant oils (Lerma-Garcia *et al*, 2010). However, there is no available information regarding the detection and quantification of grapeseed oil (GO)

and sesame oil (SeO) as AO adulterants using FTIR-ATR aided with PLS.

2. Materials and methods

2.1 Sample preparation

Avocado oil was extracted from dried avocado pulp powder using cold percolation technique with *n*-hexane as the extracting solvent. Grapeseed oil and sesame oil were purchased from supermarket in Yogyakarta, Indonesia. For quantitative analysis using PLS calibration, a set of calibration samples containing AO with GO as well as AO and SeO were prepared accurately in proportions of 2-95 %v/v of GO and SeO in AO. The mixtures were shaken vigorously to assure the homogeneity. Several independent samples were prepared for predictive capability assessment of the calibration model.

2.2. Instrumentation

FTIR spectra of samples were obtained using ABB 3000 FTIR-ATR spectrophotometer (Canada) with ATR crystal of ZnSe equipped with DTGS as detector, potassium bromide (KBr) as beam splitter and integrated with the Horizon^{MB} 3000 software. The measurement was directly carried out by applying oil samples on ATR surface at controlled room temperature (25 °C) in mid infrared region (MIR) region of 4000-650 cm⁻¹. These spectra were subtracted from reference spectrum of air, acquired by collecting a spectrum from the cleaned blank ATR crystal before the measurement of each oil sample replication. The sample spectra were collected in duplicate and displayed as the average spectra. At the end of every scan, the crystal was cleaned with hexane twice and dried with special soft tissue, cleaned with acetone, and finally dried again with soft tissue following the collection of each spectrum.

2.3. Quantification using PLS calibration

The quantification using PLS were performed using software Horizon^{MB} 3000. The wavenumber region for the quantification was optimized automatically by the software and was confirmed by investigating peaks where variations were observed. PLS calibration model was cross-validated using LOO (leave-one out) technique. This model was further used to predict the level of GO and SeO in binary mixture with AO in the independent samples for evaluating its predictive capability. Preprocessing of spectra included smoothing with Savitzky-Golay methods using 9 windows and order 3 polynomial equation. Autoscaling and centering was applied automatically by software as preprocessing of data.

3. Results and discussion

3.1 FTIR spectral analysis

Some of fats and oils might have quite similar composition. Consequently, it is often difficult to detect adulteration of fats and oils physically (Christy *et al*, 2004). However, because of its capability as a

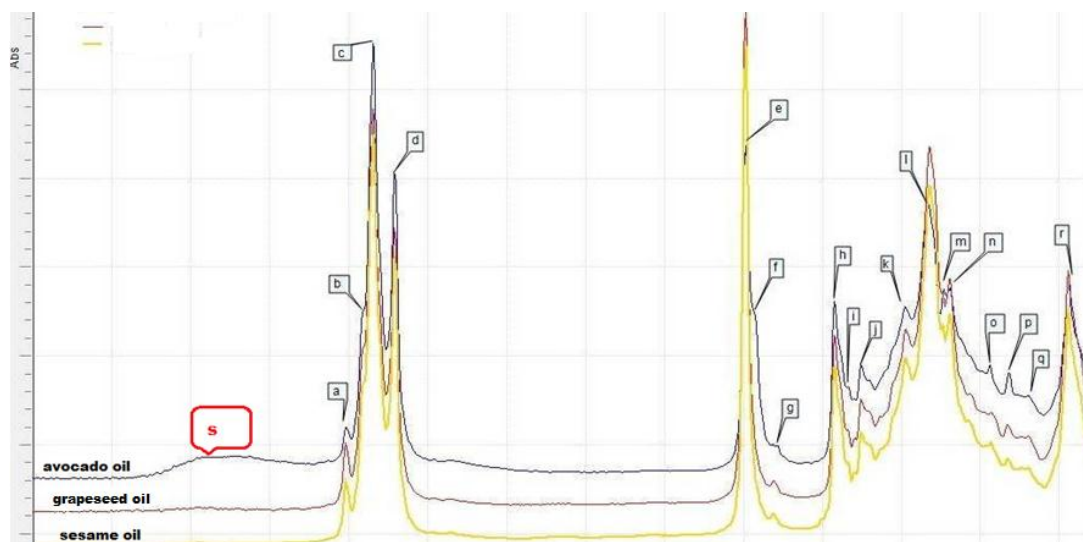


Figure 1. FTIR spectra of avocado oil, grapeseed oil and sesame oil scanned in mid infrared region (4000 – 400 cm⁻¹).

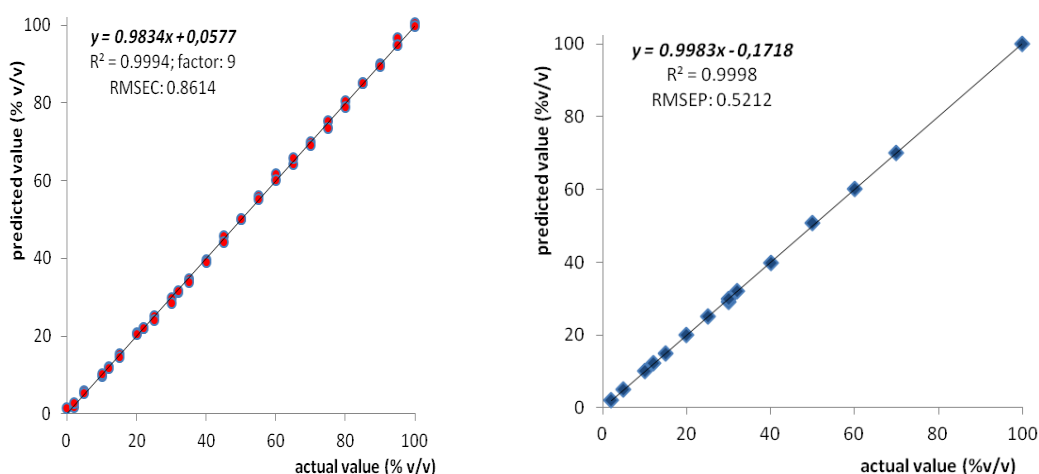


Figure 2. Relationship between actual value and FTIR predicted value of GO (●: calibration, ◆: validation).

fingerprint technique, MIR spectroscopy allows one to distinguish authentic oil and those adulterated with others by observing the spectra changes due to the adulteration (Yap *et al*, 2007). In fats and oils, most of the peaks and shoulders of the spectrum are attributable to the specific functional groups (Bendini *et al*, 2007). Triglycerides were the principal components in fats and oils and, consequently, it dominates the spectra of fats and oils (Safar *et al*, 1994). Fig.1 exhibits MIR spectra of the studied oils at wavenumber region of 4000-650 cm⁻¹. Meanwhile figure 2 illustrates the effect of adulterants in AO spectra changes.

The entire range of spectra looks similar for the three oils. This is due to the similar chemical composition in terms of fatty acids composition. The identification of bands as analytical signal was difficult when the absorption bands were overlapping. Solving this problem, the software was able to select which bands considered as the analytical signal. Peak at 3009

cm⁻¹ is due to stretching vibration of *cis* C=CH. At 2923 and 2853 cm⁻¹, two sharp peaks present due to the symmetric and asymmetric stretching vibration from the methylene (-CH₂-) group. The sharp peak with high intensity at 1744 cm⁻¹ showed the presence of carbonyl functional group (ester linkage of triacylglycerol). The stretching vibration of *cis* -C=C contributed in the presence of weak absorption band at 1654 cm⁻¹. The peaks and related functional groups are given in table 1, as depicted in Fig.1.

Taking into account the spectra, one can see that spectrum of AO revealed some differences to that of GO and SeO, especially at fingerprint region. There are 2 peaks identified at 1009 and 1114cm⁻¹ for AO spectra, and both were not observed in GO and SeO spectra. Both were attributed to C-O stretching vibration. The differences of fatty acids composition of those oils contributed to the revealed different peaks, especially at 975-900 cm⁻¹.

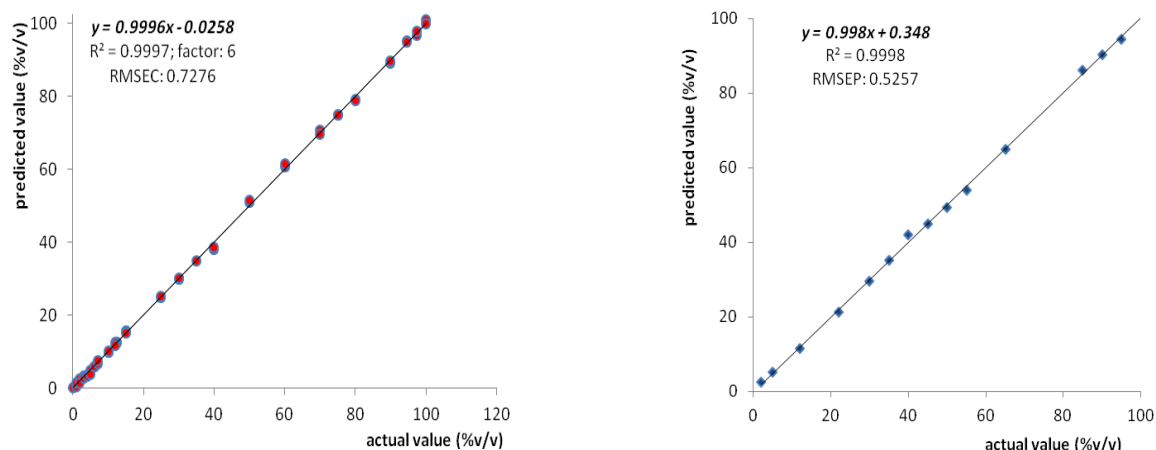


Figure 3. Relationship between actual value and FTIR predicted value of SeO (●: calibration, ◆: validation).

Table 1. Functional groups and types of vibrations in the MIR spectra of AO, GO, and SeO (Lerma-Garcia *et al*, 2010; Rohman and Ariani, 2013; dos Santos *et al*, 2014).

Peaks	frequencies (cm ⁻¹)	Functional groups	Types of vibration
a	3009	C=CH <i>cis</i>	Stretching
b	2959	-C-H (CH ₃)	Symmetrical or asymmetrical stretching
c	2922	-C-H (-CH ₂)	Stretching
d	2856	-C-H (-CH ₂)	Stretching
e	1742	-C=O ester linkage with TAG	Stretching
f	1712	-C=O	bending <i>scissoring</i>
g	1642	-C=C- <i>cis</i>	bending <i>rocking</i>
h	1461	-C-H (CH ₂)	Symmetrical bending
i	1418	=C-H- <i>cis</i>	Stretching
j	1378	-C-H- (CH ₃)	Stretching
k	1238	C-O ester	Stretching or bending
l	1165	C-O ester, -CH ₂ -	Stretching or bending
m	1115	C-O, -C-H-deformation	Bending
n	1098	C-O, -CH- of fatty acid	Bending out of plane
o	971	-CH=CH-isolated transolefin	Bending out of plane
p	908	-CH=CH- <i>trans</i>	Bending out of plane <i>wagging</i>
q	844	-CH=CH- <i>trans</i>	Bending out of plane <i>rocking</i>
r	721	-CH=CH- <i>cis</i>	Symmetrical stretching
s	3468	-OH secondary (β-cytosterol)	Symmetrical stretching

Furthermore, no bands were observed for GO and SeO at 1715 cm⁻¹, while AO has absorption bands at 1715 cm⁻¹ due to C=O ester stretching vibration of free fatty acid. Absorption of -OH from β-cytosterol at 3468 cm⁻¹ in AO spectra was not present in GO and SeO. These frequency regions can be exploited for the quantification either GO or SeO in mixtures with AO.

3.2 Quantification using PLS

For quantification using PLS, the samples were divided into the calibration and validation sets. The division into sets was done to obtain the similar mean values and standard deviations so that both sets of samples spanned the full range of adulterant contents (Wang *et al*, 2006). The suitable quantification of GO was done using the combined wavenumbers of 1006-902; 1191-1091; and 1755-1654 cm⁻¹. At this region, the highest value of R² (0.9994) and the lowest value of RMSEC (0.86 %v/v) was achieved. The high value of coefficient of determination informed that the

predictors are able to describe 99.94% variation contained in the dependent variables. Meanwhile, the rest about 0.06 % can not be described. The low value of RMSEC suggests the ability of calibration model to explain the relationship between predictors and responses. The lower RMSEC value, the better model was obtained. Table 2 showed the results of optimization process at MIR region.

The risk of using multivariate analysis is overfitting occurrence due to including noise to be counted. It occurs when the calibration model offers good R² and low RMSEC but shows bad performance in predicting the unknown samples. The little change from training set leads to significant difference in result in that case. Further, the validation is required for solving the problem. The R² of validation of 0.9998 was excellent with RMSEP 0.52 %v/v which was close to the previous RMSEC obtained. According to Rohman and Ariani (2013), that suggests the reproducibility of the method developed. Both are the measure of deviation from

Table 2. PLS performances for determination of GO and SeO in binary mixture with AO (The bolded figures were the selected region and treatment)

Frequency regions (cm ⁻¹)	adulterants	spectra	PLS factor	R ²		RMSEC
				Calibration	Validation	
1006-902; 1191-1091; 1755-1654	grapeseed oil	<i>normal</i>	9	0.9994	0.9998	0.8614
		1 st derivative	4	0.9984	0.9995	1.0977
		2 nd derivative	4	0.9980	0.9993	1.1623
4000-650	sesame oil	<i>normal</i>	6	0.9997	0.9998	0.7276
		1 st derivative	5	0.9994	0.9993	0.8761
		2 nd derivative	5	0.9993	0.9993	0.8940

observation data point to the best fitting plane in order to give the good linearity. Moreover, the closeness between RMSEC and RMSEP indicated the accuracy and robustness of the model. Therefore, the model has the good performance to predict the concentration of unknown samples.

PLS also successfully quantify SeO in the binary mixture with AO. At region of 4000-650 cm⁻¹, PLS calibration offers the highest value of coefficient of determination (0.9997) and the lowest RMSEC value (0.73 %v/v) from training set calibration. Nine factors were included in the model building for GO quantification. Meanwhile, in the calibration model for SeO, six factors well explained the variability and built the model. Those were the number of optimum value since gave the lowest PRESS value. The PRESS value is direct measure of predictive ability of calibration model during cross-validation (Smith, 2002). The PLS calibration was further used to predict the independent samples. The values of R² of 0.9998 with RMSEP value of 0.53 %v/v were considered as goodness of fit of the developed quantification model. The PLS appears to have a reasonable ability to estimate the SeO percentage in binary mixture with AO, based on the high R² and low error.

4. Conclusion

In conclusion, it is suggested that FTIR-ATR spectroscopy with PLS regression is a powerful technique for the quantitative analysis of AO in binary and ternary mixtures with GO and SeO. The developed method is rapid, accurate, simple without complex preparation of sample, and be able to considered as green analytical chemistry since there is no chemical waste on and after process.

5. Acknowledgments

The authors thank to The Faculty of Pharmacy of Universitas Gadjah Mada Indonesia for providing the funding to support this research awarded to Prof. Sugeng Riyanto and Dr. Abdul Rohman. The authors also and to Integrated Research and Testing Laboratory of Universitas Gadjah Mada (LPPT-UGM) for providing the reagents and instruments to make this study possible.

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