

# Application of Differential Scanning Calorimetry-Chemometric Coupled Procedure to the Evaluation of Thermo-Oxidation on Extra Virgin Olive Oil

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**Abstract** In this work, the opportunity of adopting a differential scanning calorimetry (DSC)-principal component analysis (PCA) coupled procedure to measure the degree of thermal stress for extra virgin olive oil (EVOO) was presented. Oil was subjected to thermal stress under convectional or microwave heating treatments at different heating times up to 1,440 and 15 min, respectively, and *p*-anisidine values (PAV) were obtained on all samples to measure their oxidative degradation. The entire DSC profiles obtained on the oil upon cooling in the range from 30 °C to −80 °C and subsequent re-heating to 30 °C at different times and under cooking procedures have been subjected to PCA data analysis. PCA discriminated samples by means of profile changes in DSC transition both upon cooling and heating not only according to treatment times (which accounted for the degree of thermo-oxidation) but also considering

different heating process. The proposed procedure may be useful to measure oil thermal stress and to select appropriate heating condition to be applied for EVOO both in industrial and/or in food-catering sectors.

**Keywords** Differential scanning calorimetry · Extra virgin olive oil · Thermo-oxidation · Chemometric procedure

## Introduction

Extra virgin olive oil (EVOO) is a well known vegetable oil, which takes a consistent part of the Mediterranean diet for its health promoting effects related to the prevention of oxidative damage, as it was recently stated by the European Food Safety Authority (EFSA) panel on Dietetic Products, Nutrition and Allergies in relation to its polyphenol content.<sup>1</sup> Its balanced chemical composition characterized by high content of monounsaturated (oleic acid in particular) fatty acids, a proportioned presence of polyunsaturated ones and such minor components as phenolic compounds, tocopherols, and carotenoids, known to act as antioxidants against reactive species, can explain its relatively high stability against oxidative sequence involving lipid molecules due to storage and/or thermal treatments.<sup>2–4</sup>

Differential scanning calorimetry (DSC) is a thermoanalytical technique widely employed for the evaluation of quality parameters of vegetable oil as thermal properties obtained by cooling and heating transitions were related to chemical composition.<sup>5</sup> Recently, correlations among thermal properties and both major and minor chemical components were also established for EVOO.<sup>6</sup> Its use presents several advantages as it does not require time-consuming

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manipulation practices and chemical treatment of the sample, avoiding the use of toxic chemicals that could be hazardous for the analyst and the environment, with well-automated analysis protocol that papers recently published have estimated to be very helpful also for the evaluation of EVOO adulteration.<sup>7,8</sup>

Among DSC applications in the field, its use for assessing oxidative deterioration of vegetable oils is well known and reviewed.<sup>9,10</sup> Several aspects were taken into consideration: the evaluation of oil stability by extrapolating induction time from isothermal curve, which were found to be related to those measured by common tests as OSI<sup>11</sup> or Rancimat,<sup>12</sup> the monitoring of the immediate quality and the expected oxidation stage after such thermal treatments as deep-frying<sup>13,14</sup> or microwave heating<sup>15,16</sup>, as changes in DSC thermal properties were found to be strictly correlated to those of standard oxidative stability indices (peroxide and anisidine values, free fatty acids, etc.).

Changes in DSC curves and related thermal properties were also discussed for olive oils after conventional<sup>17</sup> and microwave<sup>18,19</sup> thermal oxidation carried out under different conditions (i.e. temperature, time, microwave power).

In all these previous works, DSC thermograms obtained as a result of oil composition and their processing were treated by evaluating cooling and heating transition profiles and by extracting such thermal properties as enthalpy, onset, offset and peak temperatures of transitions from the curves. The chemometric processing of digitized calorimetric curves is also possible, being an alternative and attractive approach to such treatment of DSC data. Nevertheless, few examples are reported in literature, especially in the area of food research.<sup>20–22</sup>

In a previous work, a novel strategy based on coupling DSC to partial least square (PLS) chemometric methodology for the determination of fatty acid composition of olive oil was developed, presenting a suitable model for the determination of oleic acid content overall, which is related to oil health benefits.<sup>23</sup>

Multivariate methods such as principal component analysis (PCA) is useful to visualize representative features in multidimensional data, by reducing noise and data dimension. Given data matrix  $X_{(p \times t)}$ , the PCA algorithm performs a linear transformation of the set of random vectors  $x_i$  ( $i=1 \dots p$ ) into a new set of vectors ( $w_i$ , where  $i=1 \dots p$ ), the principal components (PC's). These PC's are uncorrelated and are ordered according to their ability to explain variation of the data, so that the first few retain most of the variation present in the original variables. The first PC is oriented in the direction on which the variance of the projection of the original vector is maximized, while each of the subsequent PC's is defined in the same way, being orthogonal to all the previous PC's. The loadings matrix contains a

column-wise arrangement of the weights (contribution) of the original variables on PCs. The score matrix is the product which contains information regarding data variation.<sup>24</sup>

In this work, the entire DSC profile obtained upon cooling in the range from 30 °C to -80 °C and subsequent reheating up to 30 °C on an EVOO sample has been subjected to multivariate data analysis with the aim to analyse the main calorimetric changes that occur during different thermal treatments (convection oven, OV, and microwave, MW) and to explore the opportunity of adopting a DSC-PCA coupled procedure as an accurate measurement of thermal stress degree. Compositional data on raw sample and *p*-anisidine values (PAV) values of heated oils were also provided.

## Material and Methods

### Samples

EVOO sample was supplied by Coppini Arte Olearia (Parma, Italy). The olives used for oil production were hand-picked in 2009 and belonged to two cultivars (*Nocellara del Belice* and *Ogliarola Messinese*) from Trapani (Sicily, Italy); olives were processed by a continuous industrial plant with a working capacity of 1 ton h<sup>-1</sup> equipped with a hammer crusher, a horizontal malaxator (at a temperature of 27 °C), and a three-phase decanter. The sample was stored in a dark bottle without headspace at room temperature (23±1 °C) before analysis.

### Thermal Treatment

Thermo-oxidation conditions were chosen on the basis of earlier works taking into account related changes in DSC profiles previously observed.<sup>17–19</sup> For conventional heating, an electric oven (OV) with air convection was used (FVQ105XE, Electrolux Rex, Pordenone, Italy). Three aliquots (90 ml) of oil were placed in opened 150 ml flasks (7.3 cm i.d.) and exposed at a temperature of 180 °C for 0, 30, 90, 120, 180, 360, 900 and 1,440 min.

For microwave heating (MW), a domestic oven was used (Perfect Combo MW 651, DeLonghi, Treviso, Italy). Three aliquots of oil were prepared as in conventional heating, placed on the rotatory turntable plate of the oven at equal distance and exposed at a frequency of 2,450 Hz at medium power (720 W). The oil samples were heated for 0, 3, 4.5, 6, 9, 12 and 15 min.

All heated samples were allowed to cool at room temperature (23±1 °C) for 60 min after thermal treatment prior to be immediately analysed.

## Chemical Analysis

Triacylglycerols (TAG) were analysed by HPLC coupled to both diode-array (DAD) and mass spectrometer (MSD) detectors, as previously described.<sup>18</sup> TAG were tentatively identified based on their UV–vis and mass spectra obtained by HPLC-DAD/MSD and literature data.<sup>25</sup> The results were expressed as normalized area in percentage (%). TAG are grouped according to the type of FA bonded to the glycerol structure as monosaturated triacylglycerols (MSTAG), disaturated triacylglycerols (DSTAG) and triunsaturated triacylglycerols (TUTAG). The following TAG were identified: trilinolein (LLL), dilinoleoyl-palmitoleoyl-glycerol (LLPo), oleoyl-linoleoyl-linolenoyl-glycerol (OLLn), dilinoleoyl-oleoyl-glycerol (OLL), palmitoleoyl-oleoyl-linoleoyl-glycerol (OLPo), dilinoleoyl-palmitoyl-glycerol (LLP), dioleoyl-linolenoyl-glycerol (OLnO), dioleoyl-linoleoyl-glycerol (OLO), palmitoyl-oleoyl-linoleoyl-glycerol (OLP), dioleoyl-palmitoleoyl-glycerol (OOPo), palmitoyl-palmitoleoyl-oleoyl-glycerol (POPo), triolein (OOO), stearoyl-oleoyl-linoleoyl-glycerol (SLO), dipalmitoyl-oleoyl-glycerol (POP), dioleoyl-stearoyl-glycerol (SOO) and palmitoyl-stearoyl-oleoyl-glycerol (SOP).

Fatty acid (FA) composition was determined according to Bendini et al.<sup>26</sup>, as methyl esters by capillary gas chromatography (GC), equipped with a flame ionization detector (FID), after alkaline treatment. The results were expressed as normalized area in percentage (%). Fatty acids were also reported according to their unsaturation degree, as saturated (SFA), monounsaturated (MUFA) and polyunsaturated (PUFA) fatty acids.

Evaluation of free acidity (expressed as% oleic acid) and primary oxidation products (POV, expressed as meq O<sub>2</sub>/kg lipids) were performed according to the official methods described in annex III of EEC Regulation 2568/91.<sup>27</sup> PAV determination was performed according to the IUPAC standard method 2.504, by measuring absorbance at 350 nm, on fresh and thermo-oxidized samples.<sup>28</sup> Three replicates for each determination were analyzed per sample.

## DSC Analysis

Samples of oil (8–10 mg) were weighed in aluminium pans, covers were sealed into place. Then, they were analyzed using DSC Q100 (TA Instruments, New Castle, DE, USA). Indium (melting temperature 156.6 °C,  $\Delta H_f=28.45 \text{ J g}^{-1}$ ) and *n*-dodecane (melting temperature –9.65 °C,  $\Delta H_f=216.73 \text{ J g}^{-1}$ ) were used to calibrate the instrument and an empty pan was used as reference. Oil samples were equilibrated at 30 °C for 3 min and then cooled at –80 °C at the rate of 2 °C min<sup>-1</sup>, equilibrated at –80 °C for 3 min and then heated from –80 °C to 30 °C at 2 °C min<sup>-1</sup>. Dry nitrogen was purged in the DSC cell at 50 cm<sup>3</sup> min<sup>-1</sup>. Thermograms

were analyzed with Universal Analysis Software (Version 3.9A, TA Instruments) in order to be exported in an ASCII compatible format. Three replicates were analysed per sample.

## Data Processing and PCA Models

Thermograms, in ASCII compatible format, were imported to Matlab (Mathworks Inc., Natick, MA, USA.) using routines written *ad hoc*. PCA was carried out employing Tomcat Toolbox<sup>29</sup> routine written for Matlab. PCA model was computed on overall data. The data were pre-treated in order to be transformed into a suitable form for PCA. First, the signal correction was done considering the whole unfolded thermogram. Then, the data were mean-centred (MC) (Figure 3a), providing that all the samples appear to have the same mean signal level as the ideal. The replicates were averaged and the mean was taken as individual sample. All programs were run on an ACER-Aspire 5050 computer with an AMD Turion™ 64 Mobile, 2.20 GHz microprocessor and 2.00 Gb of RAM.

## Results and Discussion

### Chemical and DSC Analysis

Chemical composition and quality parameters of EVOO are reported in Table 1. Eight TAG were separately quantified while the others were quantified as pairs (LLL + LLPo, OLL + OLPo, LLP + OLnO and OLP + OOPo). TUTAG were higher than the other groups of TAG as OOO represents the main TAG in EVOO. FA percentages fell within the range recently indicated by the Commission Regulation (EC, 2011) with an oleic/linoleic acid (O/L) ratio higher than 7 (~10.7), which is considered as the limit value to be overcome for oil oxidative stability. Free acidity of the oil was 0.4%, being below the limit ( $\leq 0.8\%$ ) set for this commercial category by the EC Regulation.<sup>30</sup>

Initial oxidative status of unheated oil was measured both by POV and PAV with the former value lower than that ( $\leq 20$ ) indicated by the European Commission Regulation<sup>30</sup> for this high quality oil, which is consumed crude, and the latter similar to that generally found in fresh oil.<sup>3</sup>

Thermo-oxidation of oil samples was evaluated only by PAV, which measure oxidation products (alkanes, alkenes, aldehydes, and ketones) formed by primary oxidation products (i.e. peroxides) mainly in final reaction stages. Data are summarized in Table 2 for all samples. PAV values increased to reach 102 after 900 min of treatment for conventionally heated oil. Values reached by samples at the longest time of treatment were not reported as it could be considered too high to be significant.

**Table 1** TAG, main FA composition and quality parameters of EVOO sample

TAG (%) <sup>a</sup>	
LLL + LLPo	3.3
OLLn	1.3
OLL + OLPo	13.3
LLP + OLnO	4.3
OLO	21.4
OLP + OOPo	11.4
POPo	1.6
OOO	25.6
SLO	11.8
POP	1.7
SOO	3.7
SOP	0.7
DSTAG	2.4
MSTAG	32.9
TUTAG	64.7
Main FA (%) <sup>a</sup>	
Palmitic acid	11.8
Oleic acid	74.1
Linoleic acid	6.9
Linolenic acid	0.7
SFA	15.8
MUFA	77.6
PUFA	7.6
Quality parameters	
Free Acidity (%)	0.4
POV (meq O <sub>2</sub> /kg of oil)	18.3

Data are expressed as mean of three determinations. RSD≤3.5%.

<sup>a</sup>The results were expressed as normalized area in percent

MW samples exhibited a trend of values comparable to those previously reported for EVOO samples heated under similar conditions<sup>19,31</sup>, with a slight decrease after 15 min

**Table 2** PAV number (n) of fresh and thermo-oxidized EVOO sample

Time (min)	PAV (n)
Fresh	5
OV	
30 min	8
90 min	20
120 min	27
180 min	34
360 min	61
900 min	102
1440 min	Nd
MW	
3 min	11
4.5 min	22
6 min	28
9 min	40
12 min	41
15 min	35

Data are expressed as mean of three determinations. RSD≤3.5%. Nd not determinable

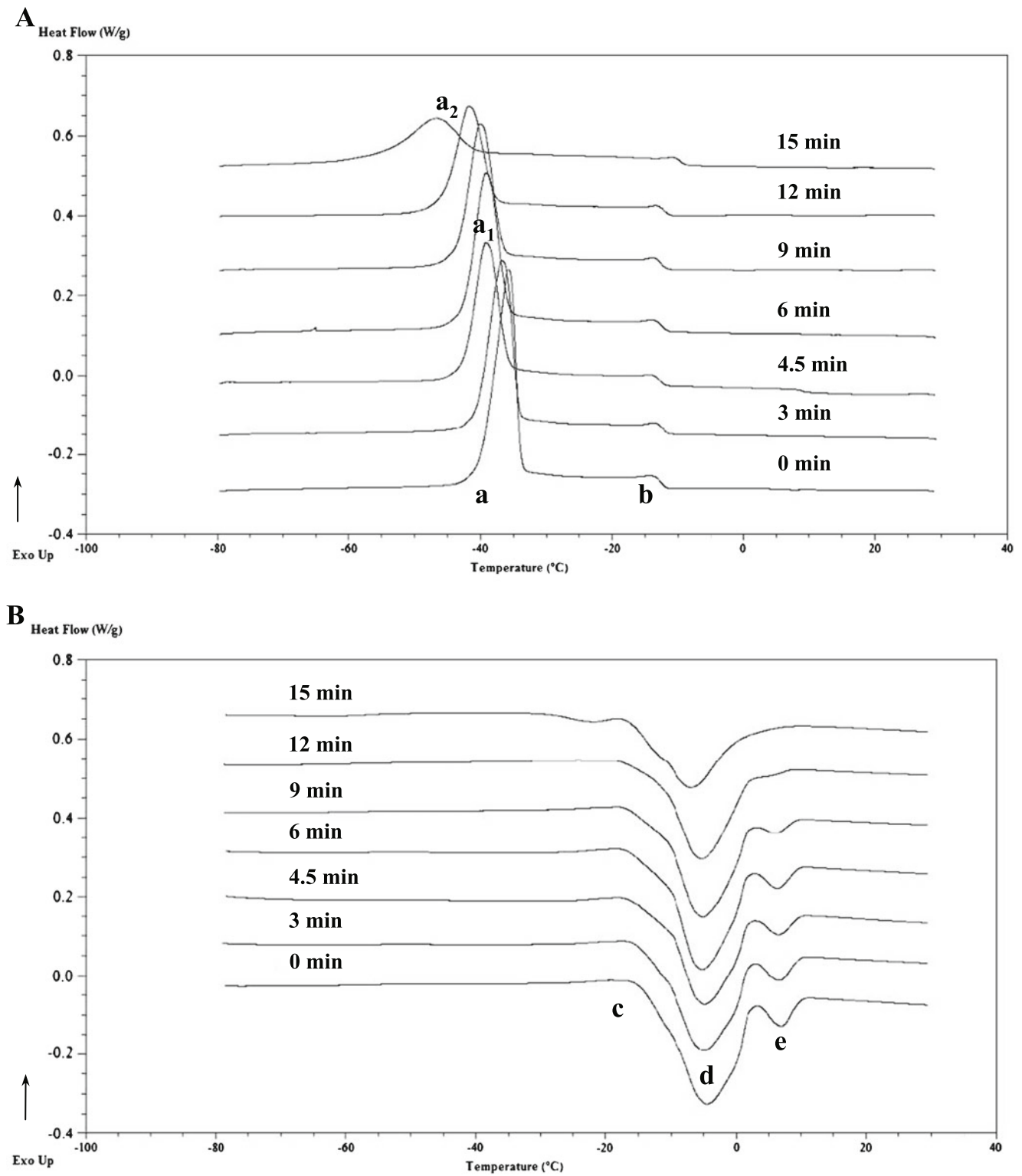
of microwave heating, but this trend was quite different from that of OV heated oil. Previous experiments, carried out under similar conditions, have shown that EVOO temperature reached 120 °C after 90 min of OV heating with a further increase to 140 °C for longer time of treatment (by unpublished data of the authors). On the other hand, temperatures of EVOO were markedly higher at the end of MW heating; from about 180 °C (at 3 min) to reach 313 °C at the longest time of heating (15 min).<sup>31</sup> Thus, it could be hypothesized that OV and MW samples probably underwent quite different kinetics of thermo-oxidation, leading to a higher lipid degradation degree for the latter heated oils in comparison with the former samples. TAG products from higher stages of lipid oxidation (e.g. polymers) were previously found in olive oil subjected to comparable times of MW heating.<sup>32</sup>

DSC thermograms, obtained for untreated and thermally stressed EVOO sample, are reported in Figure 1 for MW samples (inserts a and b, for cooling and heating, respectively) and in Figure 2 for OV oils (inset A and B, for cooling and heating, respectively).

Generally, cooling curves are more interpretable than those obtained upon heating, as crystallization of oils is well known to be influenced by chemical composition, whereas the well-known melting-re-crystallisation phenomenon, named polymorphism, could easily occur during the melting of the original oil crystals.<sup>5</sup> EVOO showed the classical cooling profile with two exothermic events, the major (peak a of Figures 1a and 2a) peaking at lower temperature ( $T_p \sim -38$  °C), which accounted for the crystallization of the majority of the most unsaturated lipid fractions and the minor (peak b of Figures 1a and 2a,  $T_p \sim -16$  °C) at higher temperature, previously related to more saturated TAG, whose profile was also found to be influenced by minor components (diacylglycerols in particular).<sup>6</sup>

DSC profile of EVOO upon heating was more complex than upon cooling as this oil exhibited multiple transitions; a minor exothermic peak (peak c of Figures 1b and 2b,  $T_p$  at  $\sim -15$  °C) and, successively, two endothermic events (peaks d and e of Figures 1b and 2b, at  $\sim -5$  and 5 °C, respectively), whose profiles appeared to show some differences in relation to fatty acid composition, especially for the peak at the highest temperature (e).<sup>23</sup> The first event (c) at the lowest temperature regions of the thermogram may be attributed to an exothermic molecular rearrangement of crystals into more stable polymorphic forms, already observed in other vegetable oils,<sup>5</sup> whereas the two endothermic peaks at higher temperature (d and e), characterized by multiple overlapping contributions, could be ascribed to the melting of crystallized lipids.<sup>33</sup>

Thermal treatment induced changes in DSC profiles both upon cooling and heating. Upon cooling, the most evident change was a shift towards lower temperature and a

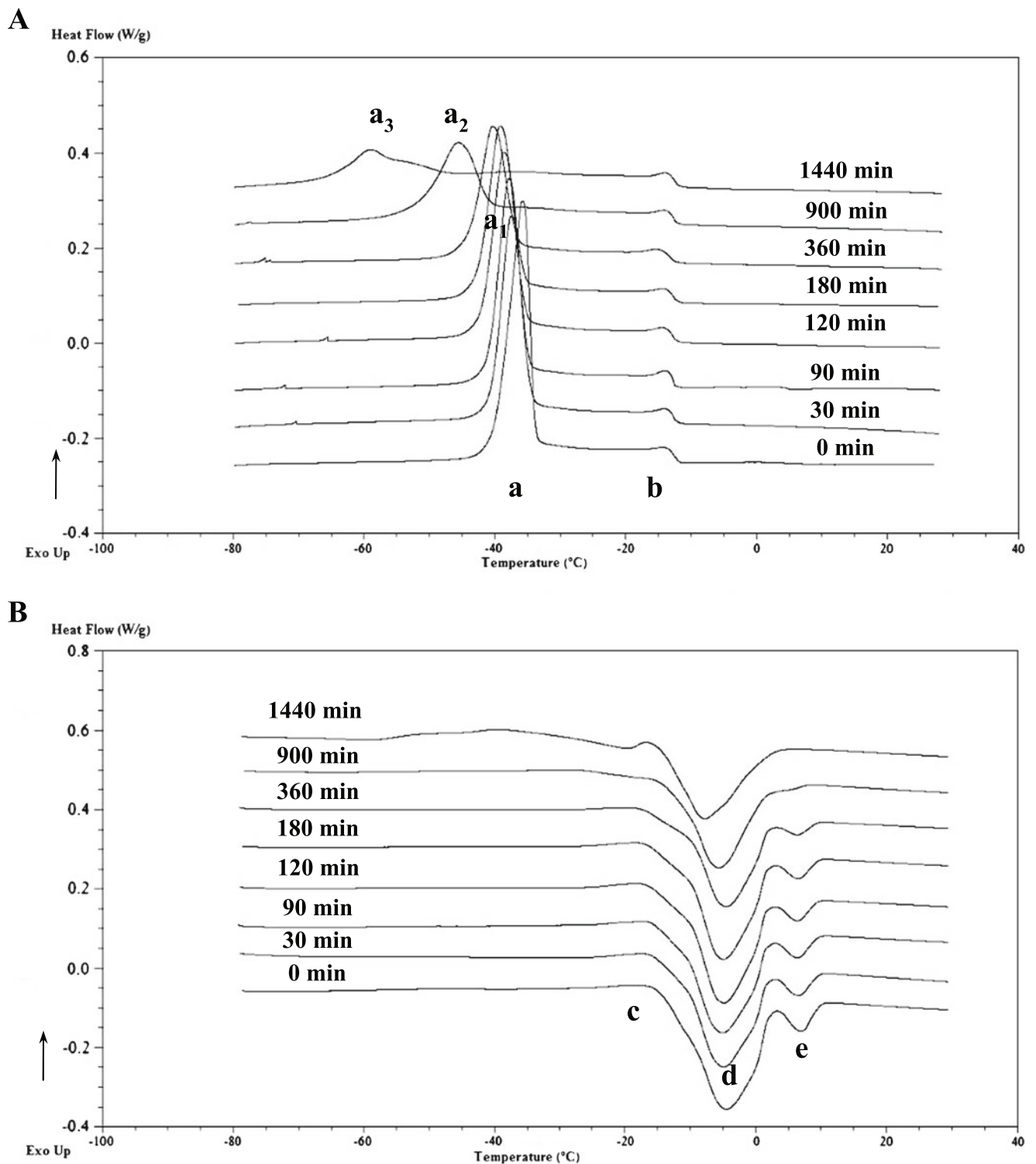


**Fig. 1** Evolution of DSC cooling (a) and heating (b) thermograms for EVOO at different MW heating times. Main transitions are indicated with lowercase letters. Cooling thermograms: (a) major exothermic peak at time 0; (a<sub>1</sub>) shifted peak a from 4.5 to 12 min of MW treatment;

(a<sub>2</sub>) shifted peak a after 15 min of MW treatment; (b) minor exothermic peak at time 0. Heating thermograms: (c) first exothermic transition at time 0; (d) major endothermic peak at time 0; (e) minor endothermic peak at time 0

decrease of height of the major exothermic peak (a) both for OV and MW samples up to 360 and 12 min of treatment

(peak a<sub>1</sub> of Figures 1a and 2a), respectively, and in relation to PAV increase (Table 2). The profile of this peak was



**Fig. 2** Evolution of DSC cooling (a) and heating (b) thermograms for EVOO at different OV heating times. Main transitions are indicated with lowercase letters. Cooling thermograms: (a) major exothermic peak at time 0; ( $a_1$ ) shifted peak a from 30 to 360 min of OV treatment; ( $a_2$ )

shifted peak a after 900 min of thermal treatment; ( $a_3$ ) shifted peak a after 900 min of thermal treatment; (b) minor exothermic peak at time 0. Heating thermograms: (c) first exothermic transition at time 0; (d) major endothermic peak at time 0; (e) minor endothermic peak at time 0

dramatically altered by both heating treatments, as this peak broadened with a consistent height decrease and a further

shift towards lower temperatures up to  $-60$  and  $-50$  °C for OV (peak  $a_3$  of Figure 2a) and MW (peak  $a_2$  of Figure 1a),

respectively, significantly enlarging the range of transition. All these changes were previously observed upon DSC cooling for thermally-oxidized EVOO samples.<sup>17–19</sup> They could be attributable to the formation of lipid polar compounds, which were found not to crystallize in the DSC cooling range of analysis.<sup>14</sup> These molecules were reported to induce a shift of crystallization transition towards lower temperatures as well as to hinder the alignment of TAG molecules and to weaken their ability to come in contact by means of intermolecular bonding, causing a depletion of crystallizing lipid.<sup>17–19,34</sup>

The minor peak (b) was less altered by thermo-oxidation. Its profile remained unchanged for OV heated samples whereas it became less evident after 15 min of MW treatment, with the maximum skewed towards higher temperatures and a shift of onset temperature of crystallization from  $-11$  to  $-8$  °C in microwaved sample, at least. This shift may be attributable to other thermal degradation phenomena rather than oxidation, as the formation of hydrolysis molecules from TAG (e.g. diacylglycerols), which were previously found to influence onset temperature of crystallization<sup>35</sup> were reported for MW heated EVOO.<sup>36</sup>

Heating profiles were also altered and became more complex than the originals, as a consequence of thermo-oxidation (Figures 1b and 2b). To the authors' best knowledge, heating thermograms of conventionally thermo-oxidized EVOO were not reported in literature, yet.

Both thermal treatments caused a shift in the major endothermic peak (d) towards lower temperature after 90 min for OV and 4.5 min for MW, respectively, when PAV became about 4 times higher than the initial value (Table 2). In addition, peak height (d) decreased and dramatically changed its profiles after 900 and 15 min of treatment, respectively, with the appearance of shoulder peaks embedded. The minor endothermic peak (e) became less evident after 360 (OV) and 9 (MW) min of heating and disappeared at 900 (OV) and 15 (MW) min. Other endothermic/exothermic transitions appeared at the lowest temperature region of thermograms (from  $-60$  °C to  $-20$  °C), at the longest times of both treatments and apart from the original transition one (c).

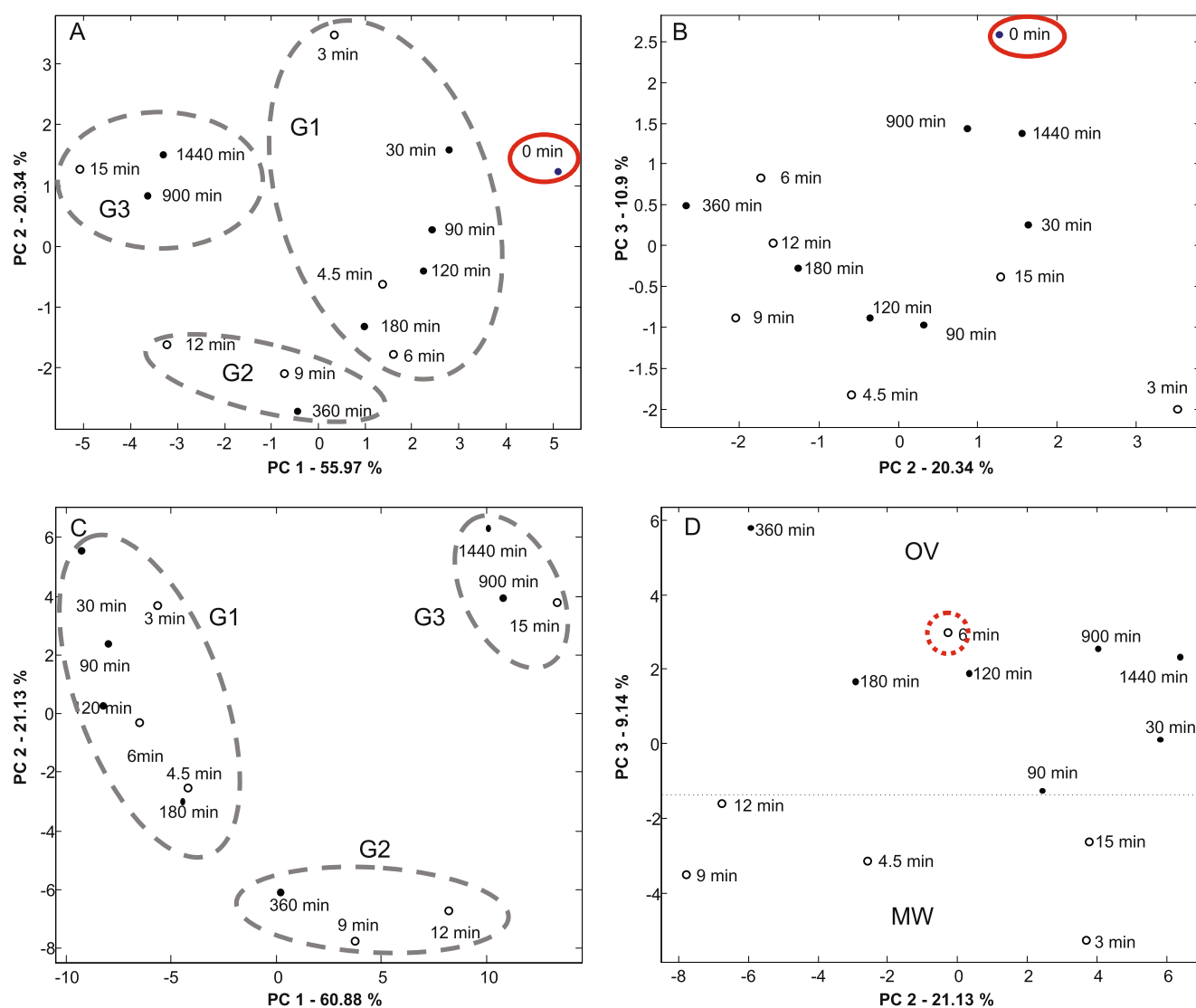
The changes in heating profiles could be attributable to the formation of different and less stable polymorphic crystals than pure oil, probably related to the formation of mixed crystals with lipid oxidation products during crystallization.<sup>37</sup> These crystals became to melt at lower temperature being more easily disrupted by heat.<sup>37</sup> Lipid oxidation molecules may have also made the transition/rearrangement of TAG polymorphic crystals more difficult, dramatically changing phase transition profile (peak c) at the lowest temperature region of the thermogram for samples at the longest time of treatments, as previously observed for EVOO samples heated under MW.<sup>18,19</sup>

## Application of PCA Models

PCA is one of the most used tools for data compression<sup>38</sup> and in this study, it was used in order to find the main DSC regions affected by thermo-oxidation that could be useful to tentatively discriminate samples according to different treatments and/or heating times. The analysis was performed on the whole digitised calorimetric curves avoiding complex procedure of extrapolation of thermal properties by thermograms.

In the first step, PCA was performed using the entire set of samples obtained in the experiment (0 min, OV samples and MW samples). PCA revealed that three principal components (PC1 to PC3) explained almost 87.21% of the total variance between the data. The scatter plots defined by the PC1 vs. PC2 and PC2 vs. PC3 components were reported in Figures 3a and b, respectively. It was observed that PC1 and PC2 were correlated to time exposure to heat (Figure 3a) discriminating among three groups of samples (named G1, G2 and G3), which were distinguished in relation to different times of treatment. G1 approximately accounted for short (from 30 to 180 min for OV and from 3 to 6 min for MW), G2 for medium (360 min for OV and from 9 to 12 min for MW) and G3 for long (G3, from 900 to 1440 for OV and 15 min for MW) heating times. These groups were also in relation to different thermo-oxidation degree, G1 exhibited PAV values lower than 35, G2 in the range 40–60, whereas G3 contained OV samples with PAV values higher than 100 and the MW heated oils that may have reached higher lipid oxidation stages than second group, but not measured by this oxidative stability index. In addition, control sample (0 min) appeared to be well resolved from the three groups above mentioned. On the other hand, OV and MW samples appeared to be not well separated by means of this PCA analysis, as shown in Figure 3b.

In order to be able to differentiate between these two heating treatments, the raw sample (0 min) was eliminated from the model, therefore reducing the variables involved and proceeding with a new PCA where only OV and MW oils were considered. In this case, the first three PC functions accumulated 91.15% of the variance explained, showing a better fitting of DSC data than the previous model. The scatter plots obtained with this PCA were reported in Figure 3c (PC1 vs. PC2) and 3d (PC2 vs. PC3). Figure 3c, showed that the 1st and 2nd PC scores were able to distinguish among the different heating time, too, preserving the separation into three groups according to heating time and oxidation stage. In addition, Figure 3d showed that the 3rd PC was able to separate among the different heating source. All OV samples presented score values higher than  $-1.5$ , whereas almost all MW samples had score values lower than cut value for 3rd PC, with the only sample at 6 min of MW treatment out of the model. This observation



**Fig. 3** First PCA plot showing MW(○) and OV(●) samples and heating time separation (grey dashed lines), control sample (0 min) is underlined with a solid line red circle; **a** 1st and 2nd scores; **b** 2nd and 3rd scores.

Second PCA plot showing MW(○) and OV(●) samples and heating time separation (grey dashed lines), sample out of model is underlined with a dashed line red circle: **c** 1st and 2nd scores; **d** 2nd and 3rd scores

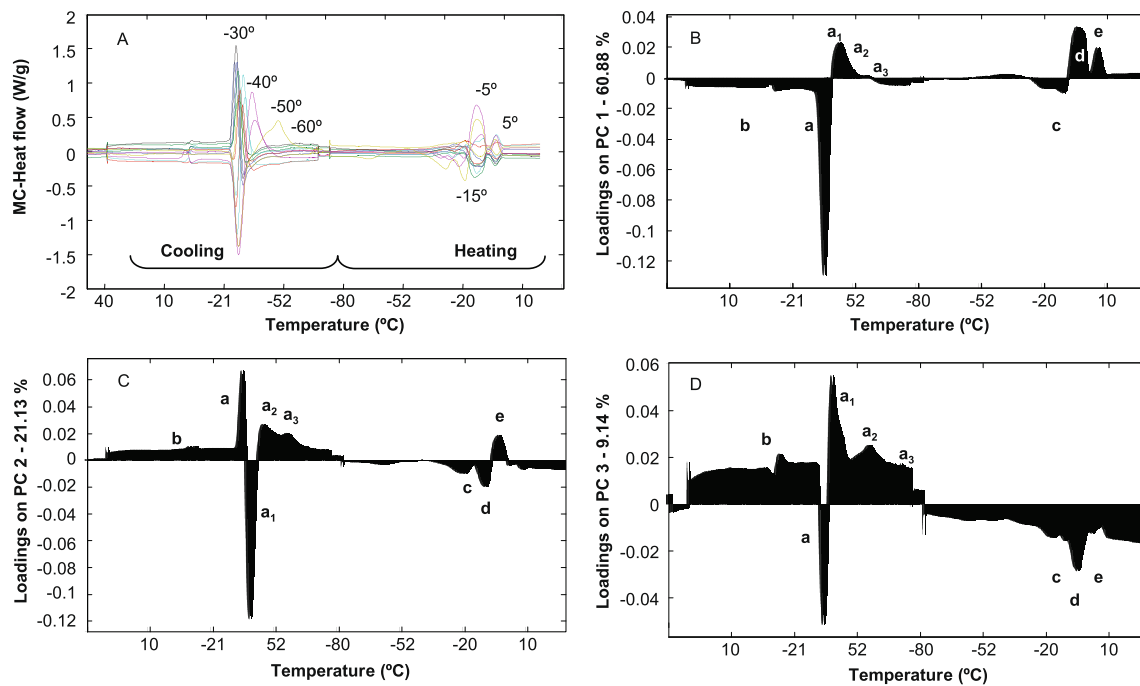
suggests that the 3rd component models could be strictly related to the type of heating process.

The loadings of these PC1, PC2 and PC3 were analysed in order to find the main regions of DSC thermograms involved in the group and/or treatment separations. A plot showing unfolded mean centred (MC) DSC signals of EVOO was shown in Figure 4a while the corresponding loading plots for PC1, PC2 and PC3 were shown in Figure 4b, c and d, respectively. The influence of the original variables (DSC heat flow) on PC score values could be better understood by means of these PC loadings plots. Positive loading values found in a defined DSC regions implied that a rise in this region has positive influence on score values. In the same way, a negative high loading value in a DSC region implied that a more positive value than the

mean in this region have a negative impact on score values for this PC.

Figure 4b shows the loading of PC1. First loading appeared to be influenced by the signal diminution (negative loading values) of the major peak of lipid crystallization (transition a of Figures 1a and 2a, peaking at about  $-30\text{ }^{\circ}\text{C}$ ) and the increase in the signal at about  $-40\text{ }^{\circ}\text{C}$  (transition a<sub>1</sub> of Figures 1a and 2a, positive values), which led to positive scores on PC1. This was related with the decrease of height and the shift towards lower temperature of the major exothermic peak (peak a<sub>1</sub> of Figures 1a and 2a), which accounted for the crystallization of the more unsaturated lipid fractions in the classical DSC cooling profile for EVOO.<sup>6</sup> Thus, G2 and G3 groups presented positive scores on PC1. On the other hand, 1st loading showed positive





**Fig. 4** Plot showing mean centred (MC) DSC signal (a) of EVOO and corresponding loading plots for 1st (b), 2nd (c) and 3rd PC (d). Cooling and heating regions of the thermograms were also indicated in insert a

values for peaks located at  $-5$  and  $5$  °C, the two endothermic events (transitions d and e of Figures 1b and 2b) related to the melting of crystallized lipids<sup>33</sup> for the heating thermogram, which accounted for a decrease of signals of these two peaks also leading to positive scores on PC1 (Figure 4b), as a consequence.

Discrimination according to PC2 appeared to be more complex as samples belonging to G1 presented both positive (OV oils at 30 and 90 min of heating and MW sample at 3 min) and negative (OV at 180 min and MW at 4.5 and 6 min) scores, thus making a further separation within this group possible. Otherwise, among more thermo-oxidized samples, G2 presented high negative and G3 high positive scores, respectively. The shift in transition a (Figures 1a and 2a) to  $a_1$  (Figures 1a and 2a) accounted for a high negative loading on PC2 (Figure 4c) leading to negative scores on this component not only for G2 samples but also for those oils of G1 that exhibited PAV values higher than 20 (Table 2). Positive loadings were found for peaks  $a_2$  and  $a_3$  (Figures 1a and 2a). These peaks were associated with a more marked shift in the major lipid crystallization transition (peak a of Figures 1a and 2a) and related to an higher level of lipid oxidation as for samples of G3 group, which presented high positive scores on PC2 (Figure 4c). Positive loading for peak a (Figures 1a and 2a) and negative loading for peak d (Figures 1b and 2b) led to positive scores on PC2 for samples from G1 group (oils with the lowest PAV values). Meanwhile, this component exhibited correlations with an increase in the intensity of the exothermic peak c (Figures 1b and 2b) at  $-15$  °C of the heating thermograms (negative

loading and positive scores on PC2) that were exhibited by samples of G3 groups, and a decrease in the intensity of peak at  $-5$  °C (transition e of Figures 1b and 2b) for the heating curve (positive loading on PC2 and positive scores).

On the 3rd PC component (PC3), which is correlated with the discrimination according to the heating treatments (Figure 3d), there was a great contribution of baseline curve both for heating and cooling profiles. The highest discrimination between the two heating treatments was placed in the overall enhancement of the DCS baseline signal for OV samples that also presented the highest score values on this PC (Figure 3d). This enhancement was related to the changes in whole cooling and heating transition profiles (Figures 2a and 2b) that were markedly altered especially at the highest treatment times. Likewise, high positive loading values for peaks  $a_1$ ,  $a_2$  and  $a_3$  (shift in peak a of Figures 1a and 2a) were also evident, being this loading contributions more evident for OV heating where the shift in the peak a was more pronounced.

## Conclusions

In conclusion, these preliminary findings give rise to the adoption of a novel strategy for the treatment of DSC data as digitised calorimetric curves could be chemometrically analysed and explored for the evaluation of thermal stress on EVOO.

Thermo-oxidized oil samples were differentiated by PCA according to changes in main DSC signals both by cooling and heating profiles. In particular, the shift in the major exothermic transition in cooling thermograms towards lower temperature and the decrease of height of the major endothermic transition of heating thermograms appeared to be most helpful to discriminate samples according to three different groups of treatment time (short, medium and long) by means of PC1 and PC2. These three groups also accounted for a different degree of thermo-oxidation in relation to PAV values. A discrimination was also possible taking into account different heating processes by means of PC2 and PC3.

In conclusion, the adopted procedure may be usefully employed to select appropriate heating conditions to be applied in relation to both the degree of thermo-oxidation and the EVOO composition. Further studies will be carried out in order to evaluate discriminant capability of the proposed strategy not only on EVOO but also on other vegetable oils with different chemical composition on the basis of the oxidative status reached by oils under the common thermal conditions used in industrial processing and food catering sectors considering several chemical stability indices.

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