1	New vacuum cooking techniques with extra-virgin olive oil show a better
2	phytochemical profile than traditional cooking methods: A foodomics study
3	Julián Lozano-Castellón <sup>1,2</sup> , Gabriele Rocchetti <sup>3</sup> , Anna Vallverdú-Queralt <sup>1,2</sup> , Montserrat
4	Illán <sup>1</sup> , Xavier Torrado-Prat <sup>1</sup> , Rosa María Lamuela-Raventós <sup>1,2*</sup> , Luigi Lucini <sup>3*</sup>
5	<sup>1</sup> Nutrition, Food Science and Gastronomy Department, XIA, Institute of Nutrition and Food
6	Safety (INSA-UB), School of Pharmacy and Food Sciences, University of Barcelona, 08028
7	Barcelona, Spain
8	<sup>2</sup> CIBER Physiopathology of Obesity and Nutrition (CIBEROBN), Institute of Health Carlos III,
9	28029 Madrid, Spain
10	<sup>3</sup> Department for Sustainable Food Process, Università Cattolica del Sacro Cuore, Via Emilia
11	Parmense 84, Piacenza, 29122, Italy
12	*corresponding authors: R.M.L-R.: lamuela@ub.edu ; L.L.: luigi.lucini@unicatt.it

#### 14 Abstract

15 In this work, the major changes in extra-virgin olive oil (EVOO) composition during cooking were assessed. A foodomics approach based on both metabolomics and 16 lipidomics was used to evaluate the impact of six different cooking techniques, three 17 traditional and three more innovative (Crock-pot®, Roner® and Gastrovac®), and the 18 effect of temperature and cooking time. The lipophilic and hydrophilic fractions of EVOO 19 20 that underwent different cooking processes were characterized by untargeted highresolution mass spectrometry approaches. Multivariate statistics were used to unravel the 21 22 differences in chemical signatures. The different cooking methods resulted in broadly 23 different phytochemical profiles, arising from thermally driven reactions accounting for hydrolysis, synthesis, and oxidation processes. The innovative cooking techniques 24 marginally altered the phytochemical profile of EVOO, whereas sauteing was the cooking 25 26 method determining the most distinctive profile. Conventional cooking methods (oven, pan-frying, and deep-frying) produced more oxidation products (epoxy- and hydroxy-27 derivatives of lipids) and markedly induced degradation processes. 28

Keywords: healthy cooking; thermal processing; Mediterranean diet; fat oxidation;
polyphenol; cuisinomics.

31

#### 32 **1.Introduction**

Extra Virgin Olive Oil (EVOO) is the main source of fat in the Mediterranean diet, well appreciated due to its flavor and known health effects. EVOO is consumed both raw and cooked; however, during thermal processes, its components can undergo transformations, oxidations, and/or degradations (Casal, Malheiro, Sendas, Oliveira, & Pereira, 2010). EVOO is mainly composed of triglycerides, with a high content of monounsaturated fatty acid (MUFA) and relatively low polyunsaturated fatty acid

(PUFA) amounts, which makes it more stable than other edible oils richer in PUFAs
(Aşkın & Kaya, 2020; Cui, Hao, Liu, & Meng, 2017).

Despite having higher stability than other edible oils, the cooking process can 41 transform some EVOO compounds, thus producing (among others) peroxides, polar 42 43 compounds, and aldehydes. Also, triglycerides can be hydrolyzed and polymerized (ben Hammouda, Freitas, Ammar, Da Silva, & Bouaziz, 2017; Santos, Cruz, Cunha, & Casal, 44 2013). In this regard, the products of hydrolysis, monoglycerides, and fatty acids, have 45 been proposed as a marker of cooked oil (Cao et al., 2019). However, unrefined oils like 46 47 EVOO also contain some other compounds, such as terpenoids, vitamins, carotenoids, 48 and polyphenols, among others which provide a protective effect during cooking (Blasi 49 et al., 2018; Jiménez, García, Bustamante, Barriga, & Robert, 2017). As a consequence of their protective properties these compounds tend to degrade during cooking 50 51 (Kalantzakis, Blekas, Pegklidou, & Boskou, 2006). In the case of phenolic compounds, previous studies found that despite the degradation, cooking at moderate temperature (i.e., 52 120 °C), the EVOO preserve enough phenolics to comply with the European Health claim 53 (European Commission Regulation EC No. 432/2012, 2012; Lozano-Castellón et al., 54 55 2020). Those bioactive compounds can migrate from the oil to the food enriching it (J. D. 56 P. Ramírez-Anaya, Samaniego-Sánchez, Castañeda-Saucedo, Villalón-Mir, & De La 57 Serrana, 2015; Vallverdú-Queralt, Regueiro, Rinaldi de Alvarenga, Torrado, & Lamuela-Raventos, 2014). Furthermore, the food can protect those phenols from degradation 58 59 during cooking (J. del P. Ramírez-Anaya et al., 2019). Besides, carotenoids, normally present as all-E isomers, can form Z-isomers during heating (Vallverdú-Queralt, 60 Regueiro, de Alvarenga, Torrado, & Lamuela-Raventos, 2015) which are more 61 bioavailable (Unlu et al., 2007). Carotenoids during heating are also transformed to apo-62

carotenoids (Rinaldi de Alvarenga et al., 2019), which still present antioxidant activity
(Müller, Reynaud, Goupy, Caris-Veyrat, & Böhm, 2012).

Depending on the type of cooking, the potential reactions may change according to the contact with the air, the temperature of cooking, and some other factors able to alter the oxidation and degradation processes (Goulas, Orphanides, Pelava, & Gekas, 2015; Santos et al., 2013). For example, Saleem *et al.* (2017) reported that cooking at 140 °C does not deteriorate the EVOO (Saleem et al., 2017).

Previous studies have assessed the effect of cooking on fatty acids and/or some minor 70 compounds, mainly by using targeted analytical approaches (Chiou & Kalogeropoulos, 71 72 2017). These latter are useful to determine the degradation rate of selected compounds, 73 but all the new products formed remain still unclear. Also, few studies exploited an 74 untargeted analytical approach; in this regard, Blasi et al (2018) reported the differences 75 in terms of phenolics between EVOO and EVOO enriched with a carotenoid extract during frying, but with no reference about the effect of cooking methods on the entire 76 77 EVOO metabolome (Blasi et al., 2018). Furthermore, most of the previous studies dealing with EVOO and cooking have been done in the lab and not real conditions, i.e., heating 78 79 the oil for extended periods (36h) (Brenes, García, Dobarganes, Velasco, & Romero, 80 2002) or in a non-normally gadget, such as a beaker (Brkić Bubola, Klisović, Lukić, & Novoselić, 2020). 81

Therefore, starting from the previous considerations, the aim of this study was to comparatively assess the effect of different cooking methods on the phytochemical profile of EVOO, considering both its hydrophilic and lipophilic fractions. To determine which changes occur and how EVOO functional compounds could be modified. To this aim, we used untargeted metabolomics and lipidomics approaches based on ultra-high-pressure liquid chromatography (UHPLC) coupled with high-resolution mass spectrometry

(HRMS) detectors (such as QTOF and Orbitrap) to provide a wide perspective on EVOO 88 89 chemical profile. Overall, six different cooking techniques have been assessed, including three conventional and three more innovative, to evaluate each technique's impact on the 90 degradation of EVOO. These different techniques inherently require different 91 temperatures and present different oxygen contact; cooking time was an additional 92 processing factor under investigation. To the best of our knowledge, this is the first work 93 94 using both metabolomics and lipidomics on EVOO to find possible marker compounds of each cooking methods under investigation. The final aim was to hierarchically assess 95 each factor's weight to affect the EVOO quality, thus considering the cooking method 96 97 itself and different combinations of temperature/time.

98 2. Materials and methods

99 2.1. Reagents

Methanol, water, tert-butyl methyl ether, and isopropanol were LC-MS grade supplied
by Merck (Darmstadt, Germany). Formic acid and ammonium formate (LC-MS grade)
were supplied by sigma Aldrich (St. Louis, USA).

103 2.2. EVOO samples and cooking processes

104 The EVOO sample was kindly provided by "Organización Interprofesional del Aceite 105 de oliva Español". The sample was from "Picual" cultivar and labeled as extra-virgin olive oil, it was harvested in autumn 2019 in Spain. To standardize the experimental 106 107 conditions, all EVOO samples used for the cooking processes came from the same batch. 108 In this work, we used three conventional techniques, namely sauteing, deep-frying, and oven. Moreover, three innovative cooking methods consisting of a low-temperature 109 110 vacuum cooking carried out with a Roner® apparatus, a slow-cooker pot carried out with a Crockpot® apparatus, and the vacuum pot cooking process, carried out with a 111 Gastrovac® apparatus were also chosen. The cooking processes were performed at the 112

Food Torribera Campus, University of Barcelona (Santa Coloma de Gramenet, Spain), 113 114 except for the Gastrovac® experiments, which were carried out at CETT, School of 115 Tourism, Hospitality and Gastronomy, University of Barcelona (Barcelona, Spain). The EVOO was cooked using the six different techniques, using for every technique 2 116 temperatures (one high and one low) within the common interval of use. These 117 temperatures were selected according to the chef's criteria, based on those temperatures 118 119 normally applied at domestic conditions for each traditional technique and at restaurant conditions for the more innovative ones, except for the slow-cooker experiments, which 120 was determined by the apparatus as explained below. Furthermore, two cooking times 121 122 were assessed for each temperature, one in which the food was with "al dente" texture 123 and one with the food well cooked. In order to find the optimal time for each technique and temperature, a regular portion of potatoes and chicken (200 and 100 g, respectively) 124 125 was cooked and the time was determined. Table 1 reports the times and temperatures chosen for each cooking technique. The detailed and compared cooking processes are 126 explained below. All the cooking process were done in triplicate. After each cooking 127 cycle, the oil was cooled down and stored in vacuum bags at -20 °C for further analysis. 128

#### 129 2.2.1. Sauteing

130 For the sauteing process, the pan (20 cm diameter, 0.8 mm thickness, stainless steel 18/10, Excalibur, Pujadas, Girona, Spain) was heated in on an electrical cooking plate 131 (180 mm diameter, 1500 W, model Encimera EM/30 2P, Teka®, Madrid, Spain) until the 132 133 required temperature was reached. Then 200 g of EVOO were added, and the oil was heated for the desired time. The temperature was monitored with a laser thermometer 134 135 (error: ±1 °C, ScanTemp 410, TFA Dostmann GmbH & Co. KG, Wertheim, Germany) during all the process and the heat was reduced or increased when needed.

136

2.2.2. Deep-frying 137

For the deep-frying process, 200 g of EVOO were heated in a domestic fryer (model
Electro 1L, Electrodomésticos JATA, S.A., Tudela, Spain) at the convenient temperature
for the appropriate time. The temperature was monitored and controlled with its own
thermometer.

142 *2.2.3. Oven* 

For the oven, a professional restauration oven was used (model Welbilt WED 106,
Cleveland Range Ltd. Concord, Canada). The oven was heated to the desired temperature,
then the oil placed in a steel tray was introduced inside the oven for the required cooking
time.

147 2.2.4. Crock-pot apparatus (slow cooking)

For the slow-cooker process, a Crock-pot® apparatus was used (Model 148 SCCPRC507B-050, Oster Electrodomésticos Ibérica S.L., Aravaca, Spain), first it was 149 150 needed to determine the temperatures, as the apparatus just has "low" and "high" program, but the temperature cannot be controlled. For the low temperature, the "low" 151 program was selected, and the temperature was monitored to be 70 °C. In the case of the 152 153 "high" program, the temperature was 85 °C. For the cooking process 200 g of EVOO 154 were added to the pot, the desired program was selected, and the oil was cooked for the 155 required time.

156 *2.2.5. Roner apparatus (low temperatures)* 

For the low-temperature process, a Roner® apparatus was used (model 999999951, J.P.Selecta S.A., Abrera, Spain). The water bath was set at the desired temperature and when it was reached 200 g of EVOO inside a plastic vacuum bag, were placed in the bath and cooked.

161 *2.2.6. Gastrovac apparatus (vacuum cooking)* 

Finally, for the vacuum pot cooking process a Gastrovac® apparatus was used (model 20000, International Cooking Concepts S.A., Barcelona, Spain). The apparatus consists of an electric stove, a pot connected to a vacuum machine and a thermometer. The pot was heated and when the corresponding temperature was achieved 200 g of EVOO was added and the vacuum was set at maximum; the oil was cooked for each time.

## 167 *2.3. Extraction of hydrophilic compounds*

For the extraction of the hydrophilic compounds, 200  $\mu$ L of EVOO sample were weighed and suspended in 1 mL of a hydroalcoholic solution of methanol 80%, acidified with 0.1% formic acid (Blasi et al., 2018). The samples were stirred in a conical stirrer, centrifuged for 3 min at 1574 g and 4 °C, and then 500  $\mu$ L of the methanol extract was directly filtered with a 0.22  $\mu$ m syringe filter in a 2-mL vial before further analysis. Analyses were done immediately after the extraction step.

# 174 *2.4. Extraction of lipophilic compounds*

For the extraction of the lipophilic compounds, 200  $\mu$ L of EVOO sample were weighted and solved with 800  $\mu$ L of tert-butyl methyl ether. The samples were frozen at -20 °C for the precipitation of the triglyceride fraction. Thereafter, 500  $\mu$ L were taken and overnight evaporated. Samples were then resuspended in 500  $\mu$ L of a solution consisting of 65% isopropanol, 30% methanol, and 5% water, then stirred in a conical stirrer and centrifuged at 2460 x g for 5 min at 4 °C. Finally, 300  $\mu$ L of the supernatant was transferred to a 2 mL vial. Analyses were done immediately after the extraction.

182 2.5. Phenolic profiling by UHPLC-QTOF mass spectrometry

A metabolomics-based analysis was performed using ultra-high-pressure liquid chromatography (Agilent 1200 series) coupled to a quadrupole time-of-flight mass spectrometer (Agilent 6550 iFunnel) as previously reported by (Rocchetti et al., 2017). Briefly, the extracts were acquired in positive polarity (ESI+), using a full scan mode with

an m/z range of 100-1200 (0.8 spectra/s). The mass spectrometer worked in extended 187 188 dynamic range mode (nominal mass resolution = 30,000 FWHM). The separation was achieved using an Agilent Zorbax Eclipse Plus C18 column ( $50 \times 2.1$  mm,  $1.8 \mu$ m) with 189 190 water-acetonitrile gradient elution and a linear gradient from 6 to 94% of acetonitrile in 35 min, using 0.1% formic acid in both phases. The electrospray conditions were 191 192 previously optimized by the group (Rocchetti et al., 2018). The injection volume was 6 193 µL, the sequence was randomized and pooled Quality Control samples (QCs) were injected every ten samples and at the beginning of the sequence. QCs were analyzed in 194 195 data-dependent MS/MS mode using 12 precursors per cycle (1 Hz, 50–1200 m/z, positive 196 polarity, active exclusion after 2 spectra), with collision energies of 10, 20 and 40 eV for 197 collision-induced decomposition.

The data was processed using Agilent Profinder B.06 (Agilent Technologies) software 198 199 according to the targeted "find-by-formula" algorithm. Combining monoisotopic mass 200 information and isotope profile allowed us to achieve the highest confidence in 201 annotation, adopting a 5-ppm tolerance for mass accuracy. For compound annotation, we 202 used the comprehensive database Phenol-Explorer 3.6 (http://phenol-explorer.eu/). Also, 203 mass and retention time alignment and compounds filtering were performed in Agilent 204 Profinder B.06 software. Those compounds with mass accuracy higher than 5 ppm, with a frequency of detection within 100% of replicates in at least one kind of sample, and 205 206 having a plausible chromatogram peak feature, were retained and finally used for 207 multivariate statistical data analysis. In those QTOF experiments, a Level 2 of annotation was achieved (i.e., putatively annotated compounds), as reported by COSMOS 208 209 Metabolomics Standards Initiative (Salek, Steinbeck, Viant, Goodacre, & Dunn, 2013). The post-acquisition data analysis for phenolic compounds (by UHPLC/QTOF) was done 210 using the software Mass Profiler Professional (version: B.12.06; from Agilent 211

Technologies) as previously reported (Giuberti et al., 2018). Therein, compounds were filtered by abundance (area > 10000 counts), Log2 transformed, normalized at 75<sup>th</sup> percentile, and baselined for the median. Besides, some compounds were structurally confirmed by using a dedicated MS/MS workflow based on QC samples and MS-Dial software.

217 2.6. Lipidomic profiling by UHPLC-Q-Orbitrap mass spectrometry

218 The untargeted UHPLC-MS lipidomics analysis was done on a Q Exactive<sup>™</sup> Focus Hybrid Quadrupole-Orbitrap Mass Spectrometer (Thermo Scientific, Waltham, MA, 219 USA) coupled to a Vanquish ultra-high-pressure liquid chromatography (UHPLC) pump 220 221 and equipped with a HESI-II probe (Thermo Scientific, USA). The chromatographic separation was achieved by using a BEH C18 (2.1x100 mm, 1.7 µm) analytical column 222 223 maintained at 40 °C. The mobile phases consisted of (A) 5 mM ammonium formate and 224 0.1% formic acid in water/methanol (95/5, v/v), and (B) 5 mM ammonium formate and 0.1% formic acid in 2-propanol/methanol/water (65/30/5, v/v/v). The linear gradient and 225 226 flow rate increased linearly as follows, considering time (min), %B, flow rate (µL/min): 227 (0,10,200), (5, 50, 200), (15, 80, 250), (28, 100, 250), (30, 100, 250), (30.9, 10, 250), and 228 (35,10, 250). For the full scan MS analysis, the acquisition was performed using both 229 positive and negative ionization with a mass resolution of 70,000 at m/z 200. The automatic gain control target (AGC target) and the maximum injection time (IT) were 1e<sup>6</sup> 230 231 and 100 ms, respectively. Also, separate and randomized injections of pooled quality 232 control (QC) samples were performed in a data-dependent (Top N = 3) MS/MS mode with full scan mass resolution reduced to 17,500 at m/z 200, with an AGC target value of 233  $1e^5$ , maximum IT of 100 ms, and isolation window of 1.0 m/z, respectively. For the stage 234 of data-dependent MS/MS, the Top N ions were selected for further fragmentation under 235 stepped normalized collisional energy (i.e. 10, 20, 40 eV). The injection volume was 5 236

 $\mu$ L and the *m/z* range for the full scan analyses was 100-1500. Heated electrospray ionization (HESI) parameters were as follows: sheath gas flow 30 arb (arbitrary units) auxiliary gas flow 10 arb, spray voltage 3.5 kV for ESI+ and 2.8kV for ESI-, capillary temperature 320 °C. Prior to data collection, the mass spectrometer was calibrated using Pierce<sup>TM</sup> positive and negative ion calibration solutions (Thermo Fisher Scientific, San Jose CA, USA). To avoid possible bias, the sequence of injections for EVOO samples was randomized.

The collected UHPLC-HRMS data (.RAW file) were converted into .abf file using the 244 245 Reifycs Abf Converter and then further processed using the software MS-DIAL (version 246 4.24) (Tsugawa et al., 2015). In this regard, automatic peak finding, LOWESS 247 normalization and annotation via spectral matching (against the database LipidBlast) were performed. The mass range 100-1500 m/z was searched for peaks with a minimum 248 249 peak height of 10000 cps for ESI + and ESI - polarities. The MS and MS/MS tolerance for peak centroiding was set to 0.01 and 0.05 Da, respectively. Retention time information 250 was excluded from the calculation of the total score. Accurate mass tolerance for 251 252 identification was 0.01 Da for MS and 0.05 Da for MS/MS. The identification step was 253 based on mass accuracy, isotopic pattern, and spectral matching. In MS-DIAL, these 254 criteria were used to calculate a total identification score. The total identification score 255 cut off was 75%, considering the most common ion adducts for lipidomics. Gap filling 256 using peak finder algorithm was performed to fill in missing peaks, considering 5 ppm 257 tolerance for m/z values. Finally, the software MS-Finder (Tsugawa et al., 2016) was used to provide *in-silico* fragmentation of the not annotated mass features, considering both 258 259 Lipid Maps and FoodDB libraries available in the same software. To this aim, those compounds presenting an *in-silico* prediction score > 5 were retained. 260

261 2.7. Multivariate data analysis

The multivariate data analysis was done separately for the lipidomics and phenolic 262 263 profile data. Unsupervised hierarchical clustering analysis (HCA) was made using the online software MetaboAnalyst (Chong, Wishart, & Xia, 2019). The HCA grouped the 264 265 different samples with no class information, thus allowing to hierarchically assess the weight of each variable (i.e., method, time, temperature) of cooking. Next, the datasets 266 267 containing the raw annotations were exported into the SIMCA software (Umetrics), and 268 supervised orthogonal projection to latent structures discriminant analysis (OPLS-DA) was performed using three different class discrimination criteria (i.e., cooking technique, 269 temperature, and time). Hotelling's T2 was carried out to investigate the presence of 270 271 outliers by using 95% and 99% confidence limits for suspicious and strong outliers, respectively. Model validation parameters were also produced, goodness-of-fit (R<sup>2</sup>Y) and 272 goodness-of-prediction ( $Q^2Y$ ), adopting a  $Q^2Y$  prediction ability of >0.5 as acceptability 273 274 threshold. Finally, cross-validation of the model was performed using ANOVA on crossvalidated residuals (p < 0.01), whereas permutation testing (200 permutations) was done 275 276 to exclude overfitting. The variables' importance in projection (VIP) was used to 277 extrapolate marker compounds, i.e., those possessing a VIP score > 1. Finally, a fold change (FC) analysis of the discriminant VIP markers (ANOVA, p < 0.05) was done for 278 279 each cooking method against the raw EVOO, retaining those significant compounds with a FC value > 2. 280

281 **3. Results** 

282 *3.1. Phenolic compounds* 

The UHPLC-QTOF data obtained by using the Phenol-Explorer database for the annotation step allowed us to putatively annotate 143 phenolic compounds in the EVOO samples, mainly flavonoids, tyrosols, phenolic acids, and lignans. A comprehensive list containing phenolic annotations is available in the supplementary material, where compounds are reported together with raw abundance values and composite mass spectra.
Also, the dedicated MS/MS experiment on MS-Dial allowed us to structurally confirm
some of the most abundant compounds (supplementary material).

290 The dataset containing the significant annotations was then used for unsupervised 291 HCA, made from the fold-change heat map, to group the different cooking techniques 292 and visualize the changes in phenolic profile considering the different temperatures and 293 cooking time. The resulting grouping from the technique, the cooking temperature, and 294 the interaction between those two factors is showed in Figure 1, the complete HCA are 295 in supplementary material. This clustering approach was used for evaluating the 296 combination between temperatures and cooking techniques to hierarchically determine 297 possible interactions between the factors considered. The samples clustering by time were 298 very similar to the grouping by temperature, thus indicating an interaction between time 299 and temperature. Thereafter, in order to monitor the changes in phenolic profiles between 300 the raw EVOO sample and the different cooking methods, ANOVA (p < 0.05) and Fold 301 Change (FC) analyses (cut-off > 2) were combined in Volcano Plot, and the differential 302 compounds grouped in classes and listed either as degradation products or created 303 compounds. A comprehensive list of these compounds and their log<sub>2</sub>FC, together with 304 their VIP scores, can be found in supplementary material and a list of a representative 305 compound of each phenolic group is shown in **Table 2**.

Later, a supervised analysis based on OPLS-DA was used to find the discriminant compounds, mostly describing the changes observed as a function of the cooking method, temperatures and times. The cooking technique and temperature OPLS-DA score plots are reported in **Figures 2A** and **2C**, and the other is in the supplementary material. As it could be seen, the temperature and the cooking method presented a marked effect on the EVOO samples, whilst time had no significant effect. Also, the VIP selection method

listed 72 marker compounds for the different cooking techniques, 68 for the cooking
temperature, with 48 of those compounds being shared between the two comparisons.
These compounds, together with their VIP score for temperature and/or cooking
technique, standard error and LogFC values, are shown in supplementary material and a
representative compound of each phenolic group is listed in Table 2.

317 *3.2. Lipidomic profile* 

318 The raw data obtained from Q-Orbitrap detection allowed identifying 1163 compounds, reported in supplementary material together with their nominal exact mass, 319 320 exact mass, fragmentation pattern, retention time, and identification score. The 321 unsupervised HCA produced from the fold-change heat map was built considering the cooking technique, time and temperature. A further HCA considering only the 322 temperature and cooking technique was built to assess the effect of the interaction 323 324 between those parameters and to identify which has a more marked effect. The resulting grouping from the technique, the cooking temperature, and the interaction between those 325 326 two factors is showed in Figure 1, the complete HCA are in supplementary material. 327 Thereafter, ANOVA (p < 0.05) and Fold Change values against raw EVOO (cut-off > 2) 328 were combined in a Volcano Plot and the discriminant compounds were retained. Finally, 329 the supervised OPLS-DA models were built for cooking techniques, temperature, and time, and the graphs are shown in **Figures 2B and 2D** and in the supplementary material 330 (time). Multivariate elaboration provided outputs that corroborated the outcome of 331 332 elaborations from phenolic profiling, with cooking time showing a hierarchically less relevant effect. Also, oven and deep-frying cooking methods presented similar lipidomic 333 334 profiles, whilst sauteing was differentiated from the other cooking methods, with the innovative cooking techniques showing a comparatively less relevant impact on the 335 phytochemical profile of raw EVOO. 336

The differential compounds were again grouped in compounds that increase or degrade 337 338 or both, as a function of the specific cooking method. In the case of the generated compounds, they were sorted by class and according to the type of generation, i.e., 339 oxidation, synthesis, and hydrolyzation processes. Finally, the LogFC values, together 340 341 with the VIP scores of the cooking technique and/or temperature, and the standard error 342 of these marker compounds, are shown in supplementary material, while a representative 343 marker of each group and the amount of marker compounds per group is listed in **Table** 344 3.

345 **4. Discussion** 

## 346 *4.1. Multivariate data hierarchical modelling of cooking, temperature and time*

In this work, multivariate outputs from both lipidomic and phenolic profiles allowed us to observe very similar sample groupings, meaning that thermal stability of phenolics and lipids during cooking are related and tend to degrade and/or transform correlatively during the different cooking processes.

Going into details, HCA analysis was built for both phenolic and lipids, and 351 352 considering cooking technique, temperature and time. Moreover, to determine the effect 353 of the interaction and to assess which factor had a higher effect, an HCA of cooking 354 technique and temperature was also developed (Figure 1 and supplementary material). In the case of the stronger cooking processes, sauteing was totally differentiated from 355 356 deep-fry and oven. The multivariate elaborations show that the innovative cooking 357 techniques preserve EVOO, as presented profiles more similar to the raw EVOO than conventional cooking. Specifically, the HCA of the cooking temperature showed that 358 359 those clusters, including 170 and 200 °C samples, were characterized by a completely 360 different profile. Also, intermediate temperatures (140 and 150 °C) were found to cluster together, whilst the mildest conditions (70, 80 and 85 °C) produced similar profiles. 361

Finally, samples cooked at 120 °C cluster by themselves. This particularity was also 362 363 observed in the HCA built with both cooking technique and temperature, in which 364 sauteing at 120 °C clusters on its own. Through this analysis, it was possible to observe some different outcomes between the phenolic and lipidomic fractions. In the case of the 365 lipidomics, there was a major effect of the high temperatures, as the first group division 366 was between those samples heated at 170 °C or more and the others, independently of the 367 368 cooking method. Furthermore, the raw EVOO sample was separated from the mildly cooked samples, and the sauteing at 120 °C creates its own distinct group. This suggests 369 370 that the temperature plays a pivotal role in the EVOO transformation during cooking, 371 even though the cooking technique is also important, as the sauteing at 120 °C was well 372 differentiated from those samples heated even more, but with an oven or with a vacuum pot apparatus. On the other hand, the phenolic profile observed in HCA allowed us to 373 374 observe that the specific combination of temperature and cooking method determined the actual phenolic profile of EVOO. This might be related to the differences in oxygen 375 376 availability during cooking. For example, considering the cluster composed of Gastrovac samples cooked at 140 °C and roner at 85 °C, the absence of oxygen during the cooking 377 378 process was more important in the modification of the phenolic compounds than the 379 temperature at which the EVOO was heated. Besides, both deep-fried samples clustered together and created a grouping with the oven at 200 °C, whilst the sauteing at 170 °C 380 clustered with the oven at 150 °C. Interestingly, those two last techniques have a similar 381 382 surface-to-volume ratio and, then, a similar oxygen availability, which makes it possible to justify the grouping observed. Indeed, polyphenols are compounds typically associated 383 384 with redox imbalance processes, both in vitro and in vivo, and are well-recognized antioxidant and radical scavenging compounds (Choe & Min, 2009). On the contrary, 385 phenolics are reported to be relatively stable when mild-intermediate temperatures (in the 386

range 60-100 °C) are applied (Volf, Ignat, Neamtu, & Popa, 2014). However, the fatty 387 chain of lipids is known to undergo autoxidation and thermal oxidation via the removal 388 389 of allylic hydrogen (especially in polyunsaturated chains, where a bis-allylic methylene position is present). Then, the radical form of these lipids can eventually react with triplet 390 391 oxygen very quickly (Choe & Min, 2009). Even if the process leads to combinatory and 392 not fully elucidated steps, this indicates that the removal of allylic hydrogen is a rate-393 limiting step for thermal stability of fatty chains, thus supporting our postulations. Within 394 this context, the free radical scavenging activity provided by phenolics in contrast to lipid 395 oxidation processes is well-known and has been related to their ability to provide low 396 bond dissociation energies for the O-H group in nonpolar solvents (i.e., where hydrogen 397 bonding is not present) (Choe & Min, 2009). Consequently, phenolic compounds react 398 not only when the temperature is high but also when the oxygen availability is also high 399 and, on the contrary, fatty acids need a high temperature to remove the allylic hydrogen. For this reason, lipidomic results were more affected by the temperature while the 400 401 phenolics suffer greater transformations or degradations with the interaction between 402 temperature and cooking technique, which determines the oxygen availability.

403 In order to confirm these results from a supervised point of view, the OPLS-DA score 404 plots were built. As in the case of the hierarchical analysis, the orthogonal analysis results 405 of the untargeted profiles were found to be very similar. With this regard, it is important 406 to consider that this supervised modelling approach allows to stress out the predictive 407 variability, i.e., the variability that correlated to the factor(s) under investigation. This resulted in emphasizing that the effect on the phenolic compounds and lipidic compounds 408 409 was somehow correlated. The OPLS-DA considering the cooking method as a 410 discrimination parameter showed that innovative techniques tend to cluster with the raw EVOO, whilst the oven and deep-frying aggregate together. Interestingly, as showed in 411

the HCA, the sauteing process produced a more specific profile when considering both 412 413 phenolics and lipid compounds. Besides, the OPLS-DA models built according to the 414 temperature showed that the higher the temperature, the more extensive the metabolome/lipidome changes occurring. This is suggested by the occurrence of quite 415 416 close groups in the hyperspace at high temperatures, indicating a flattening of cooking-417 specific effects. However, cooking at 120 °C via sauteing, demonstrated to have a totally 418 different impact on the EVOO oil, likely because of the high surface-to-volume ratio and the consequent exposure to air, compared with the other techniques. Therefore, even by 419 420 this supervised modelling, we could support the previously mentioned cooking-related 421 involvement of oxygen mediated processes. Interestingly, we also found that the cooking 422 time did not play a significant role in determining the major changes during EVOO cooking. A similar conclusion was achieved in previous experiments, in which the change 423 424 of EVOO phenolic profile during a domestic sauteing process was not altered by cooking 425 time (Lozano-Castellón et al., 2020).

426 4.2. Marker compounds

Combining the VIP scores and the FC analysis, it was possible to create a table with the most discriminant compounds (VIP score > 1) for the cooking technique or for the temperature, also presenting a *p*-value < 0.05 (ANOVA, Bonferroni multiple testing correction) and a FC value >2. The changes of these compounds were compared for all cooking-temperature combinations vs. the raw EVOO sample. Therefore, two tables were created with these values, one for the phenolic (**Table 2**) and another for the lipidomic profile (**Table 3**).

434 4.2.1. Phenolic compounds

In the case of the phenolic profile, the most degraded compounds were flavonoids; forexample, luteolin-*O*-hexoside had a VIP score of 1.2 for the temperature and a LogFC of

approximately -17 for the oven, deep-frying, and sauteing cooking. Lignans were also 437 438 important marker compounds, secoisolariciresinol-sesquilignan presents a VIP score of 439 1.4 for the cooking technique and a LogFC value lower than -17. Some phenolic acids were also degraded, as *m*- and *p*-coumaric acids, which despite not having high VIP 440 scores, were found to be markers of both technique and temperature. In this case, it is 441 important to highlight that they were mostly degraded during a roner cooking, meaning 442 443 those compounds are really labile. Finally, some tyrosols were also marker compounds, likely affected during the cooking process. For example, tyrosol acetate (*p*-HPEA-AC) 444 445 was degraded during the crockpot, but not during the other techniques; this trend could 446 be explained as it is degraded, but could also be formed during cooking, which 447 compensates for its degradation during the other cooking process. This compound is formed during the ester breakdown of ligstroside aglycone or one of its derivatives 448 449 (Lozano-Castellón et al., 2020).

450 On the contrary, among the marker compounds generated during the cooking process, we found some lignan derivatives, such as 7-hydroxysecoisolariciresinol, an oxidized 451 452 form of secoisolariciresinol. Also, some synthesis products were observed, including p-453 coumaroyl tyrosine. In addition, 3,4-dihydroxyphenylglycol was another marker 454 compound of a new synthesis, which was recently reported as a marker of cooking time in a work dealing with how ingredients and time affect the metabolome of sofrito 455 456 following the addition of garlic or onion (Rinaldi de Alvarenga et al., 2020). Finally, 457 some other degradation products (including two hydroxybenzoic acids) were detected and reported in Table 2. 458

In addition to the phenolic compounds tentatively identified by UHPLC-QTOF analysis, the UHPLC-Q-Orbitrap also revealed some more lipophilic phenolics, found to be also markers of the cooking process, showing either an increasing or decreasing trend

compared with the raw EVOO. This was the case of 2-(3,4-dihydroxyphenylethyl)-6-epi-462 463 elenaiate, which is a tyrosol derivative, whose concentration was increased in the 464 innovative cooking process and in sauteing. In fact, it is classified as a degradation product, but as the process gets more aggressive (in the case of deep-frying and oven), 465 466 this compound undergoes degradation, and its concentration tends to decrease. Similarly, 467 during EVOO cooking, some phenolic compounds can interact with other compounds, as 468 is the case of  $(3\beta, 22E)$ -26,27-dinorergosta-5,22-dien-3-ol, which results from conjugation 469 between a ferulic acid and a terpenoid.

470 *4.2.2. Fatty acids and derivatives* 

471 Triacylglycerols (TG) are the main components of EVOO from a quantitative point of view. During cooking, these compounds react due to temperature, light, and oxygen to 472 form new compounds. In this regard, the main reactions widely reported are 473 474 hydrolyzation and polymerization (Santos et al., 2013). Also, the fatty acids (FA) can 475 undergo some transformations as oxidation or reaction with other EVOO components 476 (Santos et al., 2013). Overall, all of these reactions could be reflected in the markers we found. In our experimental conditions, we found several degradation products of TGs; in 477 478 particular, following the traditional cooking processes (oven, deep-frying and sauteing). 479 The same could be observed for some other fatty compounds, that are less degraded by 480 modern cooking techniques.

Also, FA and diglycerides (DG) underwent synthesis reactions with other compounds in EVOO, thus forming esters, ethers, and amides. They reacted with amino acids, forming, for example, N-palmitoyl isoleucine, i.e., the amide between palmitic acid with isoleucine. Overall, Napolitano *et al.* (2018) showed similar compounds derived from the roasting of hazelnuts (Napolitano, Cerulli, Pizza, & Piacente, 2018).

Another marker found to increase during cooking was 16:2-Glc-Stigmasterol, which results from the conjugation between a FA, a carbohydrate and a sterol. Furthermore, some hydrolysis products were proposed as marker compounds, mainly monoglycerides and diglycerides. One of these monoglycerides is the stearic acid, previously proposed as a marker of cooked oil (Cao et al., 2019).

In addition, PUFAs underwent oxidation through the attack of reactive oxygen species 491 492 to form oxylipins. These latter are bioactive compounds, being modulators of inflammation, blood pressure, and immune action (Gabbs, Leng, Devassy, Monirujjaman, 493 494 & Aukema, 2015). In this work, the oxylipins formed were mainly derived from linoleic 495 acid, in which one or both unsaturations are oxidized to epoxy, peroxide, acid or alcohol group (Brühl, 2014). We also found possible intramolecular esterification of fatty acids 496 497 to form lactones, as in the case of muricatacin. Oxylipins, namely 9,12,12-TriHODE 498 (trihydroxy- octadecadienoic acid) and 9,12,12-TriHOME (trihydroxy-octadecenoic acid) were also found as markers of the addition of garlic and onion in a sofrito cooking 499 500 process (Rinaldi de Alvarenga et al., 2020).

Finally, we found a group of FA and derivatives compounds that were markers of the cooking process, resulting in increased or degraded depending on the process. One example is the case of phosphatidylethanolamines or some diacylglycerols (DG), which are formed from the hydrolysis of one ester linkage of the TG.

505 *4.2.3. Carotenoids* 

506 Carotenoids are EVOO antioxidant compounds, two main are lutein and  $\beta$ -carotene 507 (Martakos, Kostakis, Dasenaki, Pentogennis, & Thomaidis, 2019). In our experimental 508 conditions, two degraded carotenoids were found to be markers of the cooking process, 509 namely violaxanthin and 3-hydroxy- $\beta$ , *E*-caroten-3'-one, i.e., two xanthophylls. On the

other hand, we found some generated marker compounds, as tangeraxanthin, which is alutein derivative.

512 4.2.4. Other compounds

513 Other health-related compounds present in EVOO are triterpenic acids. In particular, 514 the predominant ones are maslinic, oleanolic, and ursolic acids (Giménez et al., 2015). In 515 this work, oleanolic and ursolic acids were markers of the cooking process. In fact, these 516 latter were degraded to produce discriminant degradation products. One example is 517 queretaroic acid, which is an oleanolic acid with an alcohol group. This compound was 518 mainly generated during conventional cooking processes.

EVOO is also an important source of lipophilic vitamins, mainly vitamin E (Martakos et al., 2019). During the cooking process,  $\alpha$ -tocopherol is degraded, and some derived compounds are formed, as 13'-hydroxy- $\alpha$ -tocopherol. We also identified some vitamin D derivatives in the oil, both degraded and generated. Finally, one vitamin K derivative, namely demethylphylloquinone, was found to be a marker of the process, and it was a generated compound.

Finally, we found other marker compounds likely degraded or generated during the cooking process. These latter are part of the unsaponifiable fraction of EVOO, which is complex due to this oil is unrefined. Between the generated ones, the majority were oxidation products including epoxy, alcohols, lactones, and acids.

529 **5.** Conclusions

In this work, the specific impact of different cooking techniques, cooking time, and temperature on EVOO composition was comprehensively investigated by targeting both hydrophilic and lipophilic compounds. The results have suggested that innovative (and milder) cooking techniques preserved EVOO phytochemical profile and highlighted as the cooking time has a rather limited effect. Interestingly, the temperature presented a

hierarchically higher weight in determining the observed differences compared to
cooking time. Nonetheless, the clustering of treatments unraveled some distinctive effects
of cooking-temperature combinations, considering the more hydrophilic (polyphenols)
and nonpolar fractions. In particular, it may be postulated that phenolics were more
sensitive to cooking conditions (likely because of the related oxygen availability
conditions), while nonpolar components were more affected by cooking temperature
(thus suggesting thermal degradation processes were predominant).

The untargeted profiling allowed to holistically shed light on a broad diversity of changes occurring in EVOO during cooking. Indeed, among the marker compounds, we found chemically diverse compounds, including FAs, oxylipins, phenolic compounds, and vitamins.

Overall, this work provides new insights into the appropriate selection of specific cooking methods (both traditional and innovative) in order to preserve the EVOO components that relate to health-promoting aspects, while preserving a good palatable product. Further investigations in how food matrix affect EVOO should be done, as they can interact during cooking.

#### 551 Aknowledgements

552 This research was funded by CICYT [AGL2016-75329-R], CIBEROBN from the Instituto de Salud Carlos III, ISCIII from the Ministerio de Ciencia, Innovación y 553 Universidades, (AEI/FEDER, UE) and Generalitat de Catalunya (GC) [2017SGR 196]. 554 The authors thank the "Romeo ed Enrica Invernizzi" foundation (Milan, Italy) for its kind 555 support to the metabolomics facility. Julián Lozano-Castellón thanks the Ministry of 556 557 Science Innovation and Universities for the FPI contract [BES-2017-080017] and the Fundació Universitària Agustí Pedro i Pons to support the stay. Anna Vallverdú-Queralt 558 thanks the Ministry of Science Innovation and Universities for the Ramon y Cajal contract 559

560	(RYC-2016-19355). We wish to thank CETT for the cooking equipment and the
561	Organización Interprofesional del Aceite de Oliva Español for the EVOO samples.

#### 563 **Conflict of interest**

Rosa María Lamuela-Raventos reports receiving lecture fees from Cerveceros de España and receiving lecture fees and travel support from Adventia. The other authors declare no conflict of interest.

567 **References** 

Aşkın, B., & Kaya, Y. (2020). Effect of deep frying process on the quality of the refined

569 oleic/linoleic sunflower seed oil and olive oil. *Journal of Food Science and* 

570 *Technology*, 57(12), 4716–4725. https://doi.org/10.1007/s13197-020-04655-4

ben Hammouda, I., Freitas, F., Ammar, S., Da Silva, M. D. R. G., & Bouaziz, M.

- 572 (2017). Comparison and characterization of volatile compounds as markers of oils
- 573 stability during frying by HS–SPME-GC/MS and Chemometric analysis. *Journal*
- 574 *of Chromatography B*, *1068–1069*(October), 322–334.
- 575 https://doi.org/10.1016/j.jchromb.2017.10.063
- 576 Blasi, F., Rocchetti, G., Montesano, D., Lucini, L., Chiodelli, G., Ghisoni, S., ...
- 577 Cossignani, L. (2018). Changes in extra-virgin olive oil added with Lycium
- 578 barbarum L. carotenoids during frying: Chemical analyses and metabolomic
- approach. *Food Research International*, *105*(November 2017), 507–516.
- 580 https://doi.org/10.1016/j.foodres.2017.11.061
- 581 Brenes, M., García, A., Dobarganes, M. C., Velasco, J., & Romero, C. (2002). Influence
- 582 of thermal treatments simulating cooking processes on the polyphenol content in
- virgin olive oil. *Journal of Agricultural and Food Chemistry*, 50(21), 5962–5967.
- 584 https://doi.org/10.1021/jf020506w

- 585 Brkić Bubola, K., Klisović, D., Lukić, I., & Novoselić, A. (2020). Vegetable species
- 586significantly affects the phenolic composition and oxidative stability of extra virgin
- 587 olive oil used for roasting. *LWT*, *129*(May), 109628.
- 588 https://doi.org/10.1016/j.lwt.2020.109628
- 589 Brühl, L. (2014). Fatty acid alterations in oils and fats during heating and frying.
- 590 *European Journal of Lipid Science and Technology*, *116*(6), 707–715.
- 591 https://doi.org/10.1002/ejlt.201300273
- 592 Cao, G., Ding, C., Ruan, D., Chen, Z., Wu, H., Hong, Y., & Cai, Z. (2019). Gas
- 593 chromatography-mass spectrometry based profiling reveals six monoglycerides as
- 594 markers of used cooking oil. *Food Control*, 96(October 2018), 494–498.
- 595 https://doi.org/10.1016/j.foodcont.2018.10.013
- 596 Casal, S., Malheiro, R., Sendas, A., Oliveira, B. P. P., & Pereira, J. A. (2010). Olive oil
- 597 stability under deep-frying conditions. *Food and Chemical Toxicology*, 48(10),
- 598 2972–2979. https://doi.org/10.1016/j.fct.2010.07.036
- 599 Chiou, A., & Kalogeropoulos, N. (2017). Virgin Olive Oil as Frying Oil.
- 600 *Comprehensive Reviews in Food Science and Food Safety*, *16*(4), 632–646.
- 601 https://doi.org/10.1111/1541-4337.12268
- 602 Choe, E., & Min, D. B. (2009, October 1). Mechanisms of Antioxidants in the
- 603 Oxidation of Foods. *Comprehensive Reviews in Food Science and Food Safety*.
- 504 John Wiley & Sons, Ltd. https://doi.org/10.1111/j.1541-4337.2009.00085.x
- 605 Chong, J., Wishart, D. S., & Xia, J. (2019). Using MetaboAnalyst 4.0 for
- 606 Comprehensive and Integrative Metabolomics Data Analysis. *Current Protocols in*
- 607 *Bioinformatics*, *68*(1). https://doi.org/10.1002/cpbi.86
- 608 Cui, Y., Hao, P., Liu, B., & Meng, X. (2017). Effect of traditional Chinese cooking
- 609 methods on fatty acid profiles of vegetable oils. *Food Chemistry*, 233, 77–84.

- 610 https://doi.org/10.1016/j.foodchem.2017.04.084
- 611 European Commission Regulation EC No. 432/2012. (2012). Establishing a list of
- 612 permitted health claims made on foods, other than those referring to the reduction
- of disease risk and to children's development and health. *Official Journal of the*
- 614 *European Union L 136*, 1–40.
- Gabbs, M., Leng, S., Devassy, J. G., Monirujjaman, M., & Aukema, H. M. (2015).
- Advances in Our Understanding of Oxylipins Derived from Dietary PUFAs.

617 *Advances in Nutrition*, 6(5), 513–540. https://doi.org/10.3945/an.114.007732

- 618 Giménez, E., Juan, M. E., Calvo-Melià, S., Barbosa, J., Sanz-Nebot, V., & Planas, J. M.
- 619 (2015). Pentacyclic triterpene in Olea europaea L: A simultaneous determination
- by high-performance liquid chromatography coupled to mass spectrometry.
- *Journal of Chromatography A*, *1410*, 68–75.
- 622 https://doi.org/10.1016/j.chroma.2015.07.064
- 623 Giuberti, G., Rocchetti, G., Sigolo, S., Fortunati, P., Lucini, L., & Gallo, A. (2018).
- 624 Exploitation of alfalfa seed (Medicago sativa L.) flour into gluten-free rice cookies:
- 625 Nutritional, antioxidant and quality characteristics. *Food Chemistry*, 239, 679–687.
- 626 https://doi.org/10.1016/j.foodchem.2017.07.004
- 627 Goulas, V., Orphanides, A., Pelava, E., & Gekas, V. (2015). Impact of Thermal
- 628 Processing Methods on Polyphenols and Antioxidant Activity of Olive Oil Polar
- 629 Fraction. Journal of Food Processing and Preservation, 39(6), 1919–1924.
- 630 https://doi.org/10.1111/jfpp.12430
- Jiménez, P., García, P., Bustamante, A., Barriga, A., & Robert, P. (2017). Thermal
- stability of oils added with avocado (Persea americana cv. Hass) or olive (Olea
- 633 europaea cv. Arbequina) leaf extracts during the French potatoes frying. *Food*
- 634 *Chemistry*, 221, 123–129. https://doi.org/10.1016/j.foodchem.2016.10.051

- Kalantzakis, G., Blekas, G., Pegklidou, K., & Boskou, D. (2006). Stability and radical-
- 636 scavenging activity of heated olive oil and other vegetable oils. *European Journal*637 *of Lipid Science and Technology*, *108*(4), 329–335.
- 638 https://doi.org/10.1002/ejlt.200500314
- 639 Lozano-Castellón, J., Vallverdú-Queralt, A., Rinaldi de Alvarenga, J. F., Illán, M.,
- 640 Torrado-Prat, X., & Lamuela-Raventós, R. M. (2020). Domestic Sautéing with
- 641 EVOO: Change in the Phenolic Profile. *Antioxidants*, 9(1), 77.
- 642 https://doi.org/10.3390/antiox9010077
- 643 Martakos, I., Kostakis, M., Dasenaki, M., Pentogennis, M., & Thomaidis, N. (2019).
- 644 Simultaneous Determination of Pigments, Tocopherols, and Squalene in Greek
- 645 Olive Oils: A Study of the Influence of Cultivation and Oil-Production Parameters.
- 646 *Foods*, 9(1), 31. https://doi.org/10.3390/foods9010031
- 647 Müller, L., Reynaud, E., Goupy, P., Caris-Veyrat, C., & Böhm, V. (2012). Do Apo-
- 648 Lycopenoids Have Antioxidant Activities In Vitro? Journal of the American Oil
- 649 *Chemists' Society*, 89(5), 849–858. https://doi.org/10.1007/s11746-011-1972-z
- 650 Napolitano, A., Cerulli, A., Pizza, C., & Piacente, S. (2018). Multi-class polar lipid
- 651 profiling in fresh and roasted hazelnut (Corylus avellana cultivar "Tonda di
- 652 Giffoni") by LC-ESI/LTQOrbitrap/MS/MSn. Food Chemistry, 269(June), 125–
- 653 135. https://doi.org/10.1016/j.foodchem.2018.06.121
- 654 Ramírez-Anaya, J. D. P., Samaniego-Sánchez, C., Castañeda-Saucedo, M. C., Villalón-
- 655 Mir, M., & De La Serrana, H. L. G. (2015). Phenols and the antioxidant capacity of
- 656 Mediterranean vegetables prepared with extra virgin olive oil using different
- 657 domestic cooking techniques. *Food Chemistry*, *188*, 430–438.
- 658 https://doi.org/10.1016/j.foodchem.2015.04.124
- 659 Ramírez-Anaya, J. del P., Castañeda-Saucedo, M. C., Olalla-Herrera, M., Villalón-Mir,

660	M., de la Serrana, H. L. G., & Samaniego-Sánchez, C. (2019). Changes in the
661	antioxidant properties of extra virgin olive oil after cooking typical mediterranean
662	vegetables. Antioxidants, 8(8). https://doi.org/10.3390/antiox8080246
663	Rinaldi de Alvarenga, J. F., Quifer-Rada, P., Francetto Juliano, F., Hurtado-Barroso, S.,
664	Illan, M., Torrado-Prat, X., & Lamuela-Raventós, R. M. (2019). Using Extra
665	Virgin Olive Oil to Cook Vegetables Enhances Polyphenol and Carotenoid
666	Extractability: A Study Applying the sofrito Technique. Molecules, 24(8), 1555.
667	https://doi.org/10.3390/molecules24081555
668	Rinaldi de Alvarenga, J. F., Quifer-Rada, P., Hurtado-Barroso, S., Illan, M., Torrado-
669	Prat, X., & Lamuela-Raventós, R. M. (2020). Cuisinomics: MS-based untargeted
670	approach reveals chemical modulation by a recipe during home cooking. Food
671	Research International, 138(July), 109787.
672	https://doi.org/10.1016/j.foodres.2020.109787
673	Rocchetti, G., Lucini, L., Chiodelli, G., Giuberti, G., Gallo, A., Masoero, F., &
674	Trevisan, M. (2017). Phenolic profile and fermentation patterns of different
675	commercial gluten-free pasta during in vitro large intestine fermentation. Food
676	Research International, 97, 78-86. https://doi.org/10.1016/j.foodres.2017.03.035
677	Rocchetti, G., Lucini, L., Gallo, A., Masoero, F., Trevisan, M., & Giuberti, G. (2018).
678	Untargeted metabolomics reveals differences in chemical fingerprints between
679	PDO and non-PDO Grana Padano cheeses. Food Research International,
680	113(July), 407–413. https://doi.org/10.1016/j.foodres.2018.07.029
681	Saleem, M., Ahmad, N., Ali, H., Bilal, M., Khan, S., Ullah, R., Mahmood, S. (2017).
682	Investigating temperature effects on extra virgin olive oil using fluorescence
683	spectroscopy. Laser Physics, 27(12), 125602. https://doi.org/10.1088/1555-
684	6611/aa8cd7

685	Salek, R. M., Steinbeck, C., Viant, M. R., Goodacre, R., & Dunn, W. B. (2013). The
686	role of reporting standards for metabolite annotation and identification in
687	metabolomic studies. GigaScience, 2(1), 13. https://doi.org/10.1186/2047-217X-2-
688	13
689	Santos, C. S. P., Cruz, R., Cunha, S. C., & Casal, S. (2013). Effect of cooking on olive
690	oil quality attributes. Food Research International, 54(2), 2016–2024.

691 https://doi.org/10.1016/j.foodres.2013.04.014

692 Tsugawa, H., Cajka, T., Kind, T., Ma, Y., Higgins, B., Ikeda, K., ... Arita, M. (2015).

693 MS-DIAL: data-independent MS/MS deconvolution for comprehensive

694 metabolome analysis. *Nature Methods*, *12*(6), 523–526.

- 695 https://doi.org/10.1038/nmeth.3393
- 696 Tsugawa, H., Kind, T., Nakabayashi, R., Yukihira, D., Tanaka, W., Cajka, T., ... Arita,

697 M. (2016). Hydrogen Rearrangement Rules: Computational MS/MS Fragmentation

and Structure Elucidation Using MS-FINDER Software. *Analytical Chemistry*,

699 88(16), 7946–7958. https://doi.org/10.1021/acs.analchem.6b00770

Unlu, N. Z., Bohn, T., Francis, D. M., Nagaraja, H. N., Clinton, S. K., & Schwartz, S. J.

701 (2007). Lycopene from heat-induced cis -isomer-rich tomato sauce is more

- bioavailable than from all- trans -rich tomato sauce in human subjects. *British*
- 703 *Journal of Nutrition*, 98(1), 140–146. https://doi.org/10.1017/S0007114507685201
- Vallverdú-Queralt, A., Regueiro, J., de Alvarenga, J., Torrado, X., & Lamuela-
- 705 Raventos, R. (2015). Carotenoid Profile of Tomato Sauces: Effect of Cooking
- Time and Content of Extra Virgin Olive Oil. International Journal of Molecular
- 707 Sciences, 16(12), 9588–9599. https://doi.org/10.3390/ijms16059588
- Vallverdú-Queralt, A., Regueiro, J., Rinaldi de Alvarenga, J. F., Torrado, X., &
- 709 Lamuela-Raventos, R. M. (2014). Home Cooking and Phenolics: Effect of

- 710 Thermal Treatment and Addition of Extra Virgin Olive Oil on the Phenolic Profile
- 711 of Tomato Sauces. *Journal of Agricultural and Food Chemistry*.
- 712 https://doi.org/10.1021/jf500416n
- Volf, I., Ignat, I., Neamtu, M., & Popa, V. I. (2014). Thermal stability, antioxidant
- activity, and photo-oxidation of natural polyphenols. *Chemical Papers*, 68(1), 121–
- 715 129. https://doi.org/10.2478/s11696-013-0417-6
- 716

- 718 Figures
- 719 Figure 1:



Grouping obtained from the HCA made with the QTOF data (phenolic profile) or Orbitrap
data (lipidic profile) built with the factors cooking technique, cooking temperature (in °C)
and the interaction.





A: OPLS-DA of QTOF data using cooking technique as discriminant factor. B: OPLSDA of Orbitrap data using cooking technique as discriminant factor. C: OPLS-DA of
QTOF data using cooking temperature as discriminant factor. D: OPLS-DA of Orbitrap
data using cooking temperature as discriminant factor.

# 732 Tables

Technique	↓Temperature ↓Time	↓Temperature ↑Time	↑Temperature ↓Time	↑Temperature ↑Time
Sauteing	120°C, 8 min	120°C, 12 min	170°C, 5 min	170°C, 8 min
Deeep- frying	170°C, 5 min	170°C, 10 min	200°C, 4 min	200°C, 8 min
Oven	150°C, 20 min	150°C, 30 min	200°C, 15 min	200°C, 25 min
Crockpot	70°C, 150 min	70°C, 285 min	85°C, 150 min	85°C, 270 min
Gastrovac	80°C, 30 min	80°C, 45 min	140°C, 15 min	140°C, 25 min
Roner	70°C, 165 min	70°C, 300 min	85°C, 165 min	85°C, 300 min

733 Table 1: Summary of EVOO cooking treatment.  $\downarrow$ : low,  $\uparrow$ : high.

734

Table 2: Marker phenolic compounds of each class found through QTOF analyses, separated by if they are increase or degraded. VIP: variables' importance in
 projection of the OPLS-DA built with Temperature or cooking technique as discriminant factor. Log FC: Log(2) of the fold-change comparing each cooking

technique with the raw sample. *p*-HPEA-AC: Tyrosol acetate.

Generated	discriminant compounds	most discriminant compound	VIP score Temp	VIP score technique	LogFC Crockpot	LogFC Gastrovac	LogFC Roner	LogFC deep- frying	LogFC oven	Log FC sauteing
Flavonoids										
Flavones	1	Sinensetin	1.15	1.07	17.09	19.35	18.82	21.18	20.97	20.80
Flavonols	1	Kaempferol- <i>O</i> - trihexoside	>1	1.11	0.38	0.23	0.35	0.70	0.42	1.01
Lignans	5	Dimethylmatairesinol	1.04	1.20	16.34	8.97	8.36	0.27	1.69	4.36
Phenolic acids										
Hydroxybenzoic acids	2	2-Hydroxybenzoic acid	1.07	1.00	0.12	-0.01	1.83	19.51	21.24	10.56
Hydroxycinnamic acids		Ferulic acid-O- hexoside	>1	1.09	0.12	2.92	0.07	14.12	9.01	4.45
Other polyphenols										
Alkylmethoxyphenols	1	4-Vinylsyringol	1.15	1.17	1.86	1.19	0.74	3.21	2.49	3.89
Furanocoumarins	1	Isopimpinellin	1.15	1.12	0.29	0.29	0.06	19.59	19.17	20.14
Other polyphenols	1	3,4- Dihydroxyphenylglycol	1.15	1.07	-0.11	-0.56	-0.26	0.70	0.24	1.04
Phenolic terpenes	1	Carnosol	1.02	1.03	-0.22	7.19	-0.29	17.00	13.87	9.63
Degraded										
Flavonoids										
Anthocyans	6	Delphinidin-O- pentoside	1.31	1.10	-0.08	-0.42	-0.38	-11.20	-5.43	-2.26
Dihydrochalcones	1	Phloridzin	>1	1.05	-3.20	-3.15	-1.55	-3.99	-1.78	-2.11
Flavanones	3	8-Prenylnaringenin	1.10	1.02	-0.19	-9.69	-0.24	-19.10	-19.10	-17.44
Flavones	2	Luteolin-O-hexoside	1.24	1.07	-14.15	-13.12	-13.12	-17.14	-17.16	-17.28
Flavonols	2	Quercetin-O-pentoside	1.31	1.12	-0.16	-0.38	-0.36	-11.05	-5.34	-2.21

Isoflavonoids	2	Glycitin	1.01	1.08	-18.50	-13.42	-0.45	-18.35	-18.37	-18.50
Lignans										
Lignans	3	Lariciresinol- sesquilignan	>1	1.40	-20.01	-20.01	-20.01	-19.84	-19.79	-19.96
Phenolic acids										
Hydroxybenzoic acids	2	4-Hydroxybenzoic acid -O-hexoside	1.08	1.12	-1.30	-1.03	-1.09	-7.43	-13.97	-1.58
Hydroxycinnamic acids	3	<i>m</i> -Coumaric acid	1.06	1.16	-2.43	-2.37	-16.11	-7.32	-4.71	-7.08
Other polyphenols										
Alkylphenols	1	5-Heptadecylresorcinol	>1	1.01	-0.59	-0.55	-0.05	-15.39	-0.89	-22.89
Hydroxybenzaldehydes	1	Vanillin	>1	1.03	-17.25	-0.49	-0.03	-17.25	-11.45	1.04
Tyrosols	3	p-HPEA-AC	1.15	1.21	0.31	-1.28	0.48	0.60	0.55	0.53

742 Table 3: Marker compounds of each class found through Orbitrap analyses, separated by if they are increased, degraded or both. VIP: variables' importance in

743 projection of the OPLS-DA built with Temperature or cooking technique as discriminant factor. Log FC: Log(2) of the fold-change comparing each cooking

technique with the raw sample.

Generated	Discriminant compounds	Most discriminant compound	VIP score Temp	VIP score technique	LogFC Crockpot	LogFC Gastrovac	LogFC Roner	Log FCdeep- frying	LogFC oven	LogFC sauteing
New Formed										
FA and derivatives	32	PI(18:1/15:0)	1.74649	1.41877	4.391944	8.2872715	3.9429774	8.524108	8.915601	9.683893
Phenolic compounds and derivatives	14	O-Caffeoylshikimic acid	1.62856	1.41505	5.3970065	5.6248736	6.3705034	7.3163686	8.557368	7.966763
Others	12	Geranyl acetate	1.41995	1.58213	2.622311	2.151964	2.964643	2.5024965	2.571333	2.353322
Oxydation products	18	5-Butyltetrahydro-2-oxo-	1 51034	1 66126	1 071096	0 39695692	1 0114352	0 9875431	0 82941115	1 0001428
Other FA and derivatives	8	3-furancarboxylic acid 3-Hydroxy-hexadecanoic acid	1.60505	1.61002	0.87744284	0.45202762	1.0277257	0.8459569	0.90590745	0.65938294
Phenolic compounds and derivatives	20	13-Hydroxy-5'-O- methylmelledonal	1.45667	1.2772	1.9838253	2.0072188	2.103234	1.9235957	2.1474628	2.3930402
Carotenoids and derivatives	5	4,4'-Diapophytofluene	1.4534	1.31368	1.3135228	- 0.18357341	0.17269167	-0.9017002	-0.7525671	1.8951955
Terpenic acid and derivatives	4	Methyl $3\beta$ -hydroxy- 13(18)-oleanen-28-oate	1.38992	1.28585	2.0006738	1.5461024	0.84843785	0.92612	0.04273605	2.7423096
Vitamins and derivatives	11	13'-Hydroxy-α-tocopherol	1.41301	1.35148	1.5694126	1.5583464	1.7986315	1.849115	2.0009272	1.8696846
Others	46	Pterin	1.43307	1.58319	1.705614	1.300201	2.019796	1.5977775	1.673532	1.3951392
Hydrolization										
FA	12	$\alpha$ -Linolenic acid	1.54097	1.65921	4.6568446	2.2539718	4.4372306	3.169782	2.8576748	2.9702747
Phenolic compounds and derivatives	1	Hydroxydaidzein/Apigenin	1.29803	1.29585	1.0344255	0.1897362	0.44370523	-0.9023163	-0.8047352	0.5877536

Degraded										
FA and derivatives	67	10-Hydroxy-8-decenoic acid	1.30323	1.30866	-1.0943787	0.23167211	- 0.43355703	-2.2567995	-1.161508	-3.1817083
Phenolic compounds and derivatives	33	Butyl O-caffeoylquinate	1.57418	1.35638	-1.3318475	0.6814499	-2.3654459	0.04668316	-0.6469526	0.9593978
Carotenoids and derivatives	2	3-Hydroxy- $\beta$ , <i>E</i> -caroten- 3'-one	1.08632	1.03855	- 0.26328963	-1.6357712	-0.2701796	0.15731113	-0.5132378	-1.3777789
Terpenic acid and derivatives	3	Katonic acid/ Ursolic acid	1.13848	1.20005	- 0.18030563	-0.4533887	0.25251913	-1.7398878	-1.4326813	-1.4248419
Vitamins and derivatives	14	1α,24,25-trihydroxy-22- oxavitamin D3	1.13527	1.06238	0.14750274	0.20444027	0.16522105	-1.5150608	-1.2004497	-0.5781701
Others	45	4α-Formyl-4β-methyl-5α- cholesta-8-en-3β-ol	1.65249	1.40777	-2.316343	- 0.09582913	-3.181325	-0.8616666	-1.2215797	- 0.10636723
Generated and degraded										
FA and derivatives	14	<i>O</i> -α- Glucopyranosyl - mannitol	1.30383	1.32783	1.0625315	0.07058764	0.3712975	-1.3880334	-1.1108049	0.59258974
Phenolic compounds and derivatives	7	Artoindonesianin R	1.28768	1.26356	1.0390304	-0.6923979	0.4073812	-3.398105	-2.3019292	-0.5265567
Others	11	Integerrimine N-oxide	1.33708	1.36664	1.5224164	0.04542001	0.5260237	-2.0447052	-1.8462828	0.9733645