

Matching in vitro bioaccessibility of polyphenols and antioxidant capacity of soluble coffee by Boosted Regression Trees.

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2 **soluble coffee by Boosted Regression Trees.**

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26 **ABSTRACT**

27 The aim of this study was to evaluate changes in polyphenol profile and antioxidant
28 capacity of five soluble coffees throughout a simulated gastro-intestinal digestion,
29 including absorption through a dialysis membrane. Our results demonstrate that both
30 polyphenol content and antioxidant capacity were characteristic for each type of studied
31 coffee, showing a drop after dialysis. Twenty-seven compounds were identified in
32 coffee by HPLC-MS, while only 14 of them were found after dialysis. Green+roasted
33 coffee blend and chicory+coffee blend showed the highest and lowest content of
34 polyphenols and antioxidant capacity before *in vitro* digestion and after dialysis,
35 respectively. Canonical correlation analysis showed significant correlation between the
36 antioxidant capacity and the polyphenol profile before digestion and after dialysis.
37 Furthermore, boosted regression trees analysis (BRT) showed that only 4 polyphenol
38 compounds (5-*p*-coumaroylquinic acid, quinic acid, coumaroyl tryptophan conjugated
39 and 5-O-caffeoylquinic acid) appear to be the most relevant to explain the antioxidant
40 capacity after dialysis, being these compounds the most bio-accessible after dialysis. To
41 our knowledge, this is the first report matching the antioxidant capacity of foods with
42 the polyphenol profile by BRT, which opens an interesting method of analysis for future
43 reports on the antioxidant capacity of foods.

44

45 **KEYWORDS**

46 polyphenol profile, *in vitro* gastro-intestinal digestion, bioaccessibility, chemometrics,
47 boosted regression trees.

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51 **INTRODUCTION**

52 Coffee is one of the most popular beverages consumed in the world, which has been
53 consumed for its pleasant flavor and aroma as well as its stimulatory properties due to
54 its caffeine content. In recent years, there has been an increasing interest in the possible
55 positive implications of coffee consumption for human health¹.

56 Coffee has been proposed as an important source of antioxidants in the human diet.
57 Epidemiological studies show that moderate coffee consumption may help to prevent
58 chronic diseases such as Type 2 Diabetes Mellitus², Parkinson's³ and liver⁴ diseases.
59 Species (*Coffea arabica*, Arábica or *Coffea canephora*, Robusta), cultivars⁵, origin⁶,
60 process and degree of roasting⁷ and different extraction processes⁸ can influence the
61 chemical composition and biological activity of coffee infusions. Among the
62 compounds having antioxidant activity in coffee, we can find phenolic compounds¹,
63 melanoidins and other products of Maillard reaction⁹.

64 Mullen *et al.*¹⁰ found a statistically significant correlation between the content of
65 caffeoylquinic acids in coffee berries and its ability to scavenge free radicals. On the
66 other hand, Somoza *et al.*¹¹ demonstrated that chlorogenic acid was the compound with
67 the highest influence on the antioxidant activity, evaluated *in vitro* via the inhibition of
68 the peroxidation of linoleic acid. However, some phenolic compounds can be lost in the
69 roasting process¹², forming new compounds derived from Maillard reaction, with
70 antioxidant properties⁸. Nicoli *et al.*¹³ found that grains with intermediate roasting
71 conditions had high antioxidant capacity. Daglia *et al.*¹⁴ showed that melanoidins
72 resulting from Maillard reaction would be responsible for the antioxidant capacity found
73 in high molecular weight fractions in roasted coffee.

74 These studies demonstrate that *in vitro* antioxidant capacity of coffee would be
75 influenced by its composition and by the roasting process, but little is known about the

76 bioavailability that these antioxidants have in the human digestive system, as a previous
77 step to their absorption and distribution to exert effects at the cellular level. Thus, only
78 the compounds that are able to tolerate the conditions found throughout the gastro-
79 intestinal tract, crossing the intestinal membrane, will be able to produce physiological
80 changes in the human body. So far, models simulating *in vitro* digestion have been
81 developed to investigate the digestibility and bioaccessibility of polyphenols¹⁵. These
82 models simulate the movement of food through the digestive tract, exposing the food to
83 the conditions encountered in the gastric and intestinal canals. This involves the
84 addition of digestive enzymes (pepsin, pancreatin) and bile salts, with pH and
85 temperatures similar to the conditions found *in vivo*. Then dialysis may be performed,
86 where the substances that could potentially pass through intestinal wall, can be
87 measured by one or more chemical-biochemical assays. This methodology has been
88 proposed as an estimation of bioaccessibility of food components in different food
89 matrices¹⁵⁻¹⁷. However, to our knowledge, it has been used in only one research work to
90 evaluate the bioaccessibility of polyphenols in coffee, but without using the dialysis
91 step¹⁸.

92 The main goal of this study was to assess the bioaccessibility of polyphenols arising
93 from soluble coffees by *in vitro* digestion, including a final dialysis to simulate
94 intestinal absorption, looking to understand how antioxidants present in coffee and other
95 foods may exert their effect in the human body.

96

97 MATERIAL AND METHODS

98 **Coffee samples.** Soluble coffee samples (regular, decaffeinated, Arabic, green + roasted
99 blend and chicory + coffee blend) were commercially obtained in supermarkets from

100 Tres Cantos, Madrid, Spain. Three random samples from each variety, corresponding to
101 different commercial brands, were obtained (n= 15).

102 **Chemicals and Materials.** Ultra-pure water (<5 $\mu\text{g L}^{-1}$ TOC) was obtained from a
103 purification system Arium 61316-RO plus Arium 611 UV (Sartorius, Germany).
104 Methanol (HPLC grade) and formic acid (puriss. p.a. for mass spectroscopy) were
105 provided by J. T. Baker (Edo. de México, México) and Fluka (Steinheim, Germany),
106 respectively. Commercial standards of ferulic acid and caffeic acid were obtained from
107 Extrasynthèse (Genay, France), 5-O-caffeoylquinic acid and quinic acid were purchased
108 from Sigma-Aldrich (Steinheim, Germany) and *p*-coumaric acid was provided by Fluka
109 (Dorset, U.K.). Filters (0.45 μm , HVLP04700) were obtained from Millipore (São
110 Paulo, Brazil). ABTS (2,2'-azino-bis-(3-thylbenzothiazolne-6-sulfonic acid)
111 diammonium salt), TPTZ (2,4,6-tripyridyl-S-triazine), Trolox (6-hydroxy-2,5,7,8-
112 tetramethyl-chroman-2-carboxylic acid), 1,10-phenanthroline, pepsin (P-7000, from
113 porcine stomach mucosa), pancreatin (P-1750, from porcine pancreas) and bile extract
114 (B-6831, porcine) were provided by Sigma-Aldrich (Switzerland). Folin-Ciocalteu
115 reagent was obtained from Panreac (Barcelona, Spain). Dialysis bag was Medicell
116 7000/2, width 34 mm, 7000 MW cut off. All other reagents were of analytical grade.

117 **Sample preparation.** Coffee brews were prepared according to manufacturer's
118 instructions: 3 g of regular (RC), decaffeinated (DC), Arabic (AC), and green + roasted
119 (GRC) coffee samples, and 6 g of chicory + coffee blend (CC) samples, were dissolved
120 with 200 mL of hot ultra-pure water (70-75°C). Coffee brews obtained were then
121 filtered, fractionated and stored at - 20°C until analysis.

122 ***In vitro* digestion.** The *in vitro* digestion procedure was performed according to the
123 method described by Ramírez-Moreno *et al.*¹⁷ with minor modifications. Briefly, 25 mL
124 of sample were adjusted to pH 2.0 with 6 M HCl and successively incubated in a

125 shaking water bath for 2 h at 37°C with 120 μL pepsin solution (40 mg mL^{-1} in 0.1 M
126 HCl) to simulate gastric digestion. After incubation 1.5 mL pancreatin-bile solution (5
127 mg pancreatin plus 25 mg porcine bile mL^{-1} in 0.1 M NaHCO_3), was added to simulate
128 intestinal digestion. The digestion products were placed in a dialysis bag and dialyzed in
129 250 mL of sodium bicarbonate solution (pH 7.5) for 3 h. Dialyzed samples were then
130 filtered, fractionated and stored at - 20°C until analysis.

131

132 Total polyphenol content (TP), polyphenolic profile (PP) and antioxidant capacity of
133 different coffee samples were studied before and after undergoing *in vitro* gastro-
134 intestinal digestion and subsequent dialysis.

135

136 **Total Polyphenols Assay.** TP of coffee was measured by the Folin-Ciocalteu (FC)
137 method, in accordance to the technique reported by Vignoli *et al.*⁸ and slightly modified
138 according to Parry *et al.*¹⁹. Coffee brews (100 μL), 10-fold diluted with ultrapure water,
139 and 500 μL of dialyzed sample were added to 3.3 and 2.9 mL of ultrapure water,
140 respectively. Folin-Ciocalteu reagent (200 μL) was added to each sample and stirred
141 (vortex). After 1 min, 600 μL of sodium carbonate solution (20% v/v) were added. The
142 samples were stirred and incubated for 2 h at room temperature in the dark. The
143 absorbance was then read at 750 nm. Gallic acid was used as standard; results are
144 expressed as g gallic acid equivalents (GAE) per 100 g fresh weight. All samples were
145 analyzed in triplicate.

146 **LC-MS.** Polyphenols were analyzed in coffee and dialyzed samples by HPLC-MS/MS
147 method, using an Agilent Technologies 1200 Series UPLC equipped with a gradient
148 pump (Agilent G1312B SL Binary), solvent degasser (Agilent G1379 B) and
149 autosampler (Agilent G1367 D SL+WP). The chromatographic separation was achieved

150 on a LUNA (Phenomenex, Torrance, CA, USA) C18 column (5 μm , 250 mm \times 4.60 mm
151 i.d.) at 35°C using a column heater module (Agilent G1316 B). The mobile phase
152 consisted of 0.5% formic acid (v/v, solvent A) and 0.5% acid formic in methanol (v/v,
153 solvent B). The solvent gradient started with 20% B and changed to 50% B along 3 min,
154 kept 5 min, followed by a second ramp to 70% B along 7 min, maintained 5 min, a third
155 ramp to 80% B along 1 min, remaining at this last condition for 9 min before the next
156 run. The flow rate was set at 0.4 mL min^{-1} and the injection volume was 40 μL . The
157 HPLC system was connected to a photodiode array detector (Agilent G1315 C Starlight
158 DAD) and subsequently to a QTOF mass spectrometer (microTOF-QII Series, Bruker),
159 equipped with electro spray ionization (ESI) source. UV-Vis spectra were registered
160 from 200 to 600 nm. Mass spectra were recorded in negative ion mode between m/z 50
161 and 1000. The working conditions for the ionization source were as follows: capillary
162 voltage, 4500 V; nebulizer gas pressure, 4.0 bar; drying gas flow, 8.0 L min^{-1} and 180°C
163 for the drying gas. Nitrogen and argon were used as nebulizer/dryer and collision gases,
164 respectively. The MS detector was programmed to perform MS and alternative MS/MS
165 from the three most abundant ions obtained in MS. MS/MS was performed using
166 collision energy of 13.0 eV. Exact mass was verified by introducing sodium formiate at
167 the beginning and at the end of each chromatographic run through the multipath valve
168 of the MicroQTOF II, located between the DAD and the ESI source. Data acquisition
169 and processing were performed using Compass Version 3.1 software and DataAnalysis
170 Version 4.0 software, respectively (Bruker Daltonics, MA-USA).

171 Polyphenols present in samples were characterized according to their retention times,
172 exact mass, UV/Vis spectra, MS and MS/MS spectra in addition to comparison with
173 authentic standards when available. When authentic standards were not available, a
174 tentative identification was performed using UV-VIS, exact MS and MS/MS,

175 considering reports from tentative compounds in the literature. Quantification of
176 polyphenols was based on external calibration curves from available phenolic standards,
177 using the mass peak areas obtained from the extracted ion chromatograms, at
178 concentrations between 1 and 100 mg L⁻¹. When the corresponding standards were not
179 available, the quantification was performed using an external standard with a similar
180 structure of the tentative compound in question. Samples and standards solutions were
181 filtered (0.45 µm) and injected in HPLC-MS/MS system. All samples were analyzed in
182 duplicate.

183 ***In vitro* antioxidant analysis.**

184 *In vitro* antioxidant activity was measured using trolox equivalent antioxidant capacity
185 (TEAC) assay, ferric reducing ability of plasma (FRAP) assay and 1, 10-phenanthroline
186 (PHEN) assay.

187 **TEAC assay.** TEAC assay was performed using adaptations of the methodology
188 described by Re *et al.*²⁰ The ABTS radical was produced by reacting 7 mM ABTS and
189 2.45 mM potassium persulfate (final concentration in 10 mL of water), keeping the
190 mixture in the dark at room temperature for 16 h before use. The aqueous ABTS^{•+}
191 solution was diluted with PBS (pH = 7.4) to an absorbance of 0.80 ± 0.02 at 734 nm.
192 Hundred fifty microliters of coffee brews (diluted 1:37.5 with ultra pure water) or
193 dialyzed samples were added to 4 mL of the TEAC solution plus 100 µL of methanol,
194 incubated for 30 min in the dark, and measured at 734 nm. The standard curve used was
195 linear between 0 and 0.02 mM trolox. Results are expressed in mmol trolox equivalents
196 (TE) per 100 g fresh weight. All samples were analyzed in triplicate.

197 **FRAP assay.** FRAP assay was performed according to Benzie and Strain²¹ with some
198 modifications. The fresh working solution was prepared by mixing 25 mL acetate buffer
199 pH 3.6 (3.1 g C₂H₃NaO₂·3H₂O and 16 mL C₂H₄O₂), 2.5 mL of a 10 mM TPTZ solution

200 in 40 mM HCl, and 2.5 mL of a 20 mM FeCl₃.6H₂O solution. Three hundred microliters
201 of coffee brews (diluted 1:60 with ultra pure water) or dialyzed samples were added to 4
202 mL of the FRAP solution plus 200 µL of methanol, incubated for 30 min in the dark and
203 measured at 593 nm. A linear dynamic range between 0 and 0.02 mM trolox was
204 observed. Results are expressed in mmol TE per 100 g fresh weight. All samples were
205 analyzed in triplicate.

206 **PHEN assay.** PHEN reagent and assay was performed according to Berker *et al.*²². Five
207 hundred microliters of coffee brews (diluted 1:10 with ultra pure water) or 1 mL of
208 dialyzed samples were added to 1 mL of PHEN reagent adding 4.5 mL of ethanol (96%)
209 to coffee samples and 4 mL to dialyzed samples, and diluting to 25 mL with ultra pure
210 water. Samples were incubated for 30 min at 50°C and measured at 510 nm. The
211 method was linear between 0 and 0.04 mM trolox. Results are expressed in mmol TE
212 per 100 g fresh weight. All samples were analyzed in triplicate.

213

214 **Statistical Analysis.**

215 Results were analyzed using the statistical package Statistica 8.0 from StatSoft Inc.
216 (2007) and the Infostat software package²³.

217 *Analysis of Variance.* ANOVA was performed using mixed models²⁴; in the case of
218 significance ($P < 0.05$), a DGC²⁵ comparison test was performed to reveal paired
219 differences between means.

220 *Canonical Correlation Analysis (CCA).* CCA was used to study the correlation between
221 antioxidant capacity (FRAP, TEAC and PHEN) and polyphenol profile of coffee
222 samples, before and after *in vitro* digestion and the subsequent dialysis.

223 *Boosted Regression Trees Analysis (BRT).* Development of predictive models to get
224 evidences on the relationship between the polyphenol profile and the antioxidant

225 activity was carried out using a statistical technique called boosted regression trees²⁶.
226 BRT is a powerful modeling method that combines regression trees and boosting
227 algorithm. This method can handle predictor variables with different types and
228 distributional characteristics. Variable selection with this model is robust to co-linearity
229 amongst predictors, outliers and lack of data and, therefore, does not require prior
230 variable selection or data reduction. Models were constructed with the “gbm” library²⁷
231 using the R software (version 3.0.3). Model over fitting was avoided by cross validation
232 (CV). In CV, the function selects a fraction of the data provided, according to the
233 parameters set, to build a model. The latter is validated with the fraction of remaining
234 data, allowing the evaluation and confirmation of the predictive quality of the model
235 built²⁶. Three parameters were adjusted to maximize model performance: the proportion
236 of data randomly selected at each iteration of the CV procedure (the “bag fraction”), the
237 contribution of each tree to the growing model (the “learning rate”) and the number of
238 nodes (interactions) in each tree (“tree complexity”). Model performance was evaluated
239 using the CV correlation (the correlation between predicted and raw data withheld from
240 the model). CV correlations close to 1 indicates good model predictions. The
241 importance of predictor variables in BRT models was evaluated using the function
242 previously described, which calculates the contribution to the model fit attributable to
243 each predictor, averaged across all trees²⁶.

244

245 **RESULTS AND DISCUSSION**

246

247 **Polyphenol analysis.**

248 **Table 1** shows mean values and standard deviations of total polyphenol content (TP) of
249 5 types of instant coffees. Green + roasted coffee blend (GRC), Arabic coffee (AC) and

250 regular coffee (RC) samples showed similar TP values (average 15.8 g GAE/100g),
251 higher than decaffeinated coffee (DC) samples (14.8 g GAE/100g), and much higher
252 than chicory + coffee blend (CC) samples, which showed the lowest TP values (8.99 g
253 GAE/100g), attributable to the substitution of coffee by chicory (60% of chicory and
254 38% of coffee). These results are in agreement with other authors. Vignoli *et al.*⁸
255 showed TP values in instant coffee samples between 14.6 and 15.1 g GAE/100g. Del
256 Pino-García *et al.*²⁸ showed TP values between 13.2 and 22.2 g GAE/100g in instant
257 regular coffee samples. On the other hand, Alves *et al.*²⁹ suggested that decaffeination
258 process has influence on TP levels. They detected greater amounts of TP in regular
259 coffee than in decaffeinated ones. Additionally, chicory is a plant used in Europe and
260 USA as a coffee substitute because it does not have caffeine. Normally it is used in
261 chicory + coffee blends to reduce dietary caffeine intake³⁰, however this plant has lower
262 amount of bioactive constituents (flavonoids, caffeic acid derivatives and other
263 polyphenols) than coffee^{31,32}.

264 With respect to individual polyphenol constituents, 27 compounds were identified in
265 coffee samples, which can be divided into 5 groups: 1 quinic acid, 20 free chlorogenic
266 acids, 3 chlorogenic lactones and 3 hydroxycinnamoyl-amino acid conjugates. **Table 2**
267 shows the parameters used for its identification.

268 Compounds identified in this study agree with those informed by others authors. Mullen
269 *et al.* (2011)¹⁰ found 16 compounds derived to chlorogenic acids in coffee fruit sample,
270 whereas Rodrigues *et al.* (2013)³³ found 26 phenolic compounds in coffee brews.

271 The most abundant compounds in coffee samples were QA, 5-CQA and 5-FQA (**Table**
272 **3**). Our current results showed that the content of QA ranged between 576 and 1700
273 mg/100g, 5-CQA ranged between 353 and 1549 mg/100g, while 5-FQA ranged between
274 429 and 1327 mg/100g. All the compounds presented significant differences among

275 studied coffee samples and its values are in agreement with those reported in the
276 literature^{33,34}. GRC, RC and AC showed the highest values in practically all the
277 compounds while CC displayed the lowest ones.

278

279 *In vitro* digestion model gives an indication as to the availability of coffee antioxidants
280 in a biological system, because this model simulates *in vivo* digestion. It is assumed that
281 the amount of dialyzable polyphenol compounds could be bio-accessible in the
282 intestine.

283 After *in vitro* digestion, a decrease of TP was observed during dialysis through the semi
284 permeable cellulose membrane (**Table 1**). The dialyzed samples showed TP values 5-
285 fold lower than the coffee samples. GRC dialysates showed the highest TP values (3.82
286 gGAE/100g), followed by AC (3.63 gGAE/100g), and while CC dialysates showed the
287 lowest TP values (1.78 g GAE/100 g), following the same trend that was observed in
288 non-digested samples.

289 Individual results for each of the polyphenol compounds investigated and their recovery
290 percents (R%) after dialysis are presented in **Table 3**. We observed substantial losses in
291 some of the polyphenol compounds after dialysis in relation to their initial content in
292 coffee samples. Thus, only 14 out of 27 compounds identified in the coffee samples
293 were quantified in dialyzed samples. Nine of them were quantified in all dialysates.
294 Conversely, CA and 5-diMCiQA were only quantified in AC and GRC dialysates; while
295 3,4-diCQA and 4,5-diCQA were quantified in GRC, and 3-diMCiQA was only
296 quantified in AC.

297 QA (431.6 - 810 mg/100g) was the most abundant compound found in dialyzed
298 samples, with R% ranging from 47 to 75%, followed by CoT (22 – 40 mg/100g; R%
299 19-42%). It is worthy to remark that 3-diMCiQA presented the highest R% (84.6) in

300 dialysates of Arabic coffee (AC). Conversely, the greatest drop was observed with 5-
301 FQA, showing an overall R% of 2.4, followed by 5-CQA (R% = 2.62).

302 Several studies have shown that the bioaccessibility of different families of polyphenols
303 in different matrices was lower than 40% when a dialysis bag was used. Gil-Izquierdo *et*
304 *al.*¹⁵ observed bioaccessibilities between 11% and 36% in flavanones from orange juice.
305 Vallejo *et al.*³⁵ obtained a total flavonoid bioaccessibility of 6% in broccoli. Akillioglu
306 and Karakaya¹⁶ reported that the bioaccessibility of TP verified by Folin's method
307 ranged 19% to 39%, in bean varieties. However, to our knowledge, there is only one
308 report on the *in vitro* bioaccessibility of polyphenols in instant coffee, using an *in vitro*
309 digestion model and ultrafiltration step¹⁸. Our current work uses dialysis bags, which is
310 more close to physiological conditions, avoiding the use of high pressure
311 (ultrafiltration), so our results could be better extrapolated with results from *in vivo*
312 models, in which the bioavailability of polyphenols is studied³⁶⁻³⁸.

313 Then, this methodology constitutes a feasible approach to determine the potential
314 availability of polyphenols. The polyphenols released from the food matrix during the
315 digestive process (named bio-accessible polyphenols) are potentially bio-available to
316 absorption through the gut barrier, and these may be useful for the interpretation of the
317 effects of food polyphenols on health.

318

319 **Antioxidant capacity.**

320 **Table 4** shows antioxidant capacity of different coffee samples before *in vitro* digestion
321 and after dialysis, using TEAC, FRAP and PHEN *in vitro* assays.

322 A similar trend was observed from three assays: RC and AC presented the highest
323 antioxidant capacity, while the lowest values were observed in CC samples. Significant
324 correlation was observed between different antioxidant tests. This was confirmed by a

325 study of the correlations between them: FRAP/ PHEN ($r = 0.911$; $P < 0.01$), FRAP/
326 TEAC ($r = 0.745$; $P < 0.01$), and PHEN /TEAC ($r = 0.682$; $P < 0.01$). These findings
327 are consistent with those reported in other studies involving TEAC and FRAP assays.
328 Vignoli *et al.*⁸ reported similar values of FRAP (76.99-139.99 mmol ET/100g) and
329 TEAC (74.99-144.03 mmol ET/100g) in Arabic and Robust coffee with different levels
330 of roasted, while Rufián-Henares *et al.*³⁹ showed similar ABTS and FRAP values (127
331 and 48 mmol ET/100g, respectively) in soluble coffee. On the other hand, Del Pino-
332 García *et al.*²⁸ found elevated correlation between ABTS and FRAP values in instant
333 coffee samples ($r = 0.9311$).

334 Differences between caffeinated and decaffeinated samples were also reported by others
335 authors. Pellegrini *et al.*⁴⁰ showed differences between caffeinated and decaffeinated
336 espresso coffee samples when they studied antioxidant capacity by TEAC and FRAP
337 assays, while Niseteo *et al.*⁴¹ found the same differences in instant coffee brews.

338 Chicory + coffee blend (CC) samples showed an antioxidant capacity nearly half less
339 than in coffee samples (RC, AR and GRC) ($P < 0.01$). These results are consistent with
340 those found by Rautenbach *et al.*⁴² They found that blended coffee-chicory had 2.5-fold
341 less antioxidant capacity than pure coffee (ORAC assay).⁴² To our knowledge, there are
342 not reports showing values of antioxidant capacity using TEAC, FRAP and PHEN
343 assays in chicory + coffee blended.

344

345 After dialysis a similar trend was also observed. The antioxidant capacity of GRC
346 dialysates was the highest followed by RC and AC, while CC dialysates remained with
347 the lower antioxidant capacity. The correlation between antioxidant capacity assays was
348 also confirmed with dialysates: FRAP/ PHEN ($r = 0.537$; $P < 0.01$), FRAP/ TEAC ($r =$
349 0.824 ; $P < 0.01$), and PHEN/TEAC ($r = 0.663$; $P < 0.01$). FRAP, TEAC and PHEN

350 showed a drop in all dialyzed samples, regarding the antioxidant capacity in coffee
351 samples. Recovery percents range from 12.7 to 35.7 %, being higher in the mixture with
352 green coffee (GRC), which means a higher antioxidant capacity in the material
353 potentially absorbed from this type of coffee, in agreement with the higher R%
354 obtained in this sample for TP and the content of caffeic acid (**Tables 1 and 3**).

355 Several studies showed that the antioxidant capacity decrease after dialysis in different
356 matrices. Bouayed *et al.*⁴³ reported a decrease in the total antioxidant capacity of
357 dialyzable compounds, compared to those observed in fresh apples (57% and 46% for
358 FRAP and ABTS test, respectively). Rodríguez-Roque *et al.*⁴⁴ showed that the
359 antioxidant capacity after dialysis decreased by 73% in soymilk. Akillioglu and
360 Karakaya¹⁶ observed a reduction ranging 1.6 to 2.1-fold in the DPPH test of pinto beans
361 after *in vitro* gastrointestinal digestion. However, to our knowledge, there are not
362 reports that show values of antioxidant capacity after dialysis step in coffee samples.

363

364 **Matching between *in vitro* antioxidant capacity and polyphenol profile.**

365 The antioxidant potential of coffee is attributed to the presence of polyphenols and
366 melanoidins, but their contribution to the antioxidant capacity varies with the intensity
367 of the roasting process, showing discrepancies in the results obtained by different
368 authors^{7,8,45}. The contribution of high molecular weight melanoidins to the antioxidant
369 capacity of coffee brews was estimated in the range of 26-38 %.³⁹ However Delgado-
370 Andrade *et al.*⁴⁵ found that the antioxidant capacity of melanoidins depends on the
371 presence of low molecular weight compounds (polyphenols), linked non-covalently to
372 the melanoidin skeleton. Other authors⁴⁶ found that only a small proportion of
373 melanoidins could be absorbed through the intestinal wall.

374 To evaluate if the antioxidant capacity found in this work is dependent on the
375 polyphenol content (before *in vitro* digestion and after dialysis), we applied simple
376 correlation analysis. We observed statistically significant correlation between TP and
377 the antioxidant capacity determined by FRAP, TEAC and PHEN assays before *in vitro*
378 digestion ($r = 0.753$; 0.871 and 0.693 , respectively) and after dialysis ($r = 0.771$; 0.851
379 and 0.717 , respectively). These results are in agreement with others authors, who
380 evaluated the antioxidant capacity in coffee samples.^{41,47} So, the antioxidant capacity
381 found in this work, evaluating instant coffee samples (before *in vitro* digestion and after
382 dialysis) could be attributed to their polyphenol profile. To confirm this hypothesis, we
383 evaluated the correlation between antioxidant capacity (FRAP, TEAC and PHEN) and
384 the entire polyphenol profile of coffee and dialyzed samples using canonical correlation
385 analysis (CCA). Before *in vitro* digestion CCA showed significant correlation between
386 antioxidant capacity and polyphenol profile of coffee samples ($r^2 = 0.99$; $P < 0.001$).
387 Additionally, CCA showed significant correlation between FRAP, TEAC and PHEN
388 with the polyphenol profile after dialysis ($r^2 = 0.93$; $P < 0.001$, using 9 polyphenols
389 quantified in all dialyzed samples). So far, CCA evidenced that the antioxidant capacity
390 of coffee samples can be reasonably linked to the polyphenol profiles in both pre-
391 digested and dialyzed samples.

392 We were also interested in evaluating the contribution of individual polyphenols to the
393 antioxidant capacity, looking for evidences on different contribution of individual
394 compounds to the antioxidant capacity. To solve this question, we applied Boosted
395 Regression Trees (BRT). Although BRT methods is applied in various fields including
396 ecology⁴⁸, epidemiology⁴⁹, agriculture⁵⁰ and highway safety⁵¹; to our knowledge, this
397 methodology has never been applied in food science. BRT identifies important predictor
398 variables, enabling complex functions to be modeled (antioxidant capacity), without

399 making assumptions about the type of data. BRT have some advantages over other
400 multivariate statistical techniques, such as multiple regression, because it is robust to
401 missing data, variable outliers, variable co-linearity, focusing on predictive accuracy
402 rather than *P*-values to indicate the significance of model coefficients⁴⁸.

403 The adjusted parameters (bag fraction, learning rate and tree complexity), performance
404 (CV correlation and number of trees) and relative influence of polyphenols for each
405 model (to TEAC, FRAP and PHEN) in coffee and dialyzed samples are presented in
406 **Table 5**. Before *in vitro* digestion and after dialysis BRT models showed good
407 performance (CV correlation) in TEAC as well as FRAP and PHEN analysis (**Table 5**).
408 BRT models showed that 90 % of the variability found in TEAC, FRAP and PHEN
409 analyses before *in vitro* digestion could be explained using 14 or 16 (relative influence
410 in bold, **Table 5**) out of 27 quantified compounds. On the other hand, after dialysis only
411 5 (relative influence in bold, **Table 5**) out of 9 quantified polyphenols are necessary to
412 explain 95 % of the variability observed in TEAC, FRAP and PHEN assays.

413 4-FQA was the most influential variable with a relative contribution of 15.9% to TEAC
414 BRT model in coffee samples, while CQL was the most significant variable for FRAP
415 and PHEN BRT models (27.3 % and 30.1 %, respectively). Additionally, other
416 predictor variables (CoT, FT, 3-FQL, 4-FQA, QA, 5-CQA, FA and 3-CQA) were also
417 important in TEAC, FRAP and PHEN models. Although these techniques explain
418 different mechanisms of action of the polyphenols, these compounds appear to be the
419 most relevant to explain the total antioxidant capacity before *in vitro* digestion.

420 On the other hand, QA was the most significant predictor for TEAC BRT model (51.8
421 %) in dialyzed samples, whereas 5-CoQA showed the highest contribution to FRAP and
422 PHEN BRT models (45.3 % and 37.6 %, respectively). Moreover, 5-CoQA, QA, CoT
423 and 5-CQA appeared in all models; so these variables appear to be the most relevant to

424 explain the antioxidant capacity after dialysis. In addition, QA, CoT and 5-CoQA were
425 the most bio-accessible compounds after dialysis (**Table 3**), with R% of 56, 27 and 27,
426 respectively, and QA, CoT and 5-CQA were also important in TEAC, FRAP and PHEN
427 BRT models before *in vitro* digestion, while 5-CoQA was important in both FRAP and
428 PHEN BRT models.

429 The marginal effect of these polyphenols (QA, CoT, 5-CoQA and 5-CQA) on
430 antioxidant capacity could be demonstrated using partial dependence plots. The plots
431 show the association of each compound with the antioxidant capacity (fitted function)
432 while all other compounds have an average effect in the model²⁶. **Figure 1** provides the
433 partial dependence plots of QA, CoT, 5-CQA and 5-CoQA on TEAC (**A**), FRAP (**B**)
434 and PHEN (**C**) BRT models of dialyzed samples. Plots demonstrate a complex pattern
435 of variation between polyphenols (QA, CoT, 5-CQA and 5-CoQA) and antioxidant
436 capacity (TEAC, FRAP and PHEN). In general, it can be seen that antioxidant capacity
437 (TEAC, FRAP and PHEN) is high when the content of QA is greater than 0.7 g/100g,
438 values of 5-CoQA is equal to 0.0195 g/100g, CoT is approximately 0.03 g/100g and 5-
439 CQA is greater than 0.0235 g/100g (**Figure 1 A, B and C**). This condition is satisfied
440 mostly by GRC samples (**Table 3**), which would explain the greater antioxidant
441 capacity found in these samples after dialysis.

442

443 These results demonstrate that the antioxidant capacity of coffee samples before and
444 after *in vitro* digestion and subsequent dialysis can be explained by the polyphenol
445 profile. It is worthy to remark that four compounds (5-CoQA, QA, CoT and 5-CQA)
446 appear to be the most relevant to explain the antioxidant capacity found after dialysis,
447 regardless of the different method used to determine the action of polyphenols (TEAC,
448 FRAP or PHEN). Additionally, three out of these four compounds (5-CoQA, QA and

449 CoT) were the most bio-accessible after dialysis. Assuming that dialysis simulates the
450 absorption of compound in the small intestine, we could affirm that these compounds
451 could be available for absorption *in vivo*, influencing cellular activities that moderate
452 the risk of several diseases and could be potentially beneficial for human health.

453 Our study has also shown that BRT method is a useful analytical tool to study the
454 contribution of polyphenols to the antioxidant capacity. To our knowledge, this is the
455 first report using this approach in food science.

456

457 **ABBREVIATIONS**

458 Regular (RC), decaffeinated (DC), Arabic (AC), green + roasted coffee blend (GRC)
459 chicory + coffee blend (CC). Total polyphenols content (TP). Quinic acid (QA), 3-O-
460 caffeoylquinic acid (3-CQA); 4-O-caffeoylquinic acid (4-CQA); 1-O-feruloylquinic
461 acid (1-FQA); *cis*-5-O-caffeoylquinic acid (*cis*5-CQA); 5-O-caffeoylquinic acid (5-
462 CQA); 3-O-feruloylquinic acid (3-FQA); 4-O-feruloylquinic acid (4-FQA);
463 caffeoylquinic lactone (CQL); 5-*p*-coumaroylquinic acid (5-CoQA); 5-O-feruloylquinic
464 acid (5-FQA); caffeic acid (CA); 3-O-dimetoxycinamoylquinic acid (3-diMCiQA); 3,4-
465 O-dicaffeoylquinic acid (3,4-diCQA); 3-O-feruloylquinic lactone (3-FQL); 4-O-
466 dimetoxycinamoylquinic acid (4-diMCiQA); 5-O-dimetoxycinamoylquinic acid (5-
467 diMCiQA); coumaroyl,caffeoylquinic acid (CoCQA); ferulic acid (FA); 3-O-caffeoyl,4-
468 O-feruloylquinic acid (3,4-CFQA); 4,5-O-caffeoylquinic acid (4,5-diCQA);
469 diferuloylquinic acid (diFQA); 4-O-caffeoyl,5-O-feruloylquinic acid (4,5-CFQA);
470 caffeoyl tryptophan conjugated (CT); dicaffeoylquinic lactone (diCQL); coumaroyl
471 tryptophan conjugated (CoT) and feruloyl tryptophan conjugated (FT). Boosted
472 Regression Trees (BRT).

473

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480

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FIGURE CAPTIONS

Figure 1. Functions fitted for boosted regression trees (BRT) model, showing the influence of QA, 5-CQA, CoT and 5-CoQA (g/100g) and their contribution (between square brackets) to fit the TEAC (**A**), FRAP (**B**) and PHEN (**C**) BRT models after dialysis.

TABLES

Table 1. Total Polyphenol content expressed in g gallic acid equivalents (GAE)/100g sample, before *in vitro* digestion and after dialysis. Values are reported as means \pm SD.

	Coffee	Dialysates	R%
Regular Coffee (RC)	15.6 \pm 0.4 a	3.33 \pm 0.20 C	21.3
Arabic Coffee (AC)	15.8 \pm 0.6 a	3.63 \pm 0.09 B	23.0
Green + Roasted Coffee blend (GRC)	16.0 \pm 0.5 a	3.82 \pm 0.09 A	23.9
Chicory + Coffee blend (CC)	9.0 \pm 0.2 c	1.78 \pm 0.07 D	19.8
Decaffeinated Coffee (DC)	14.8 \pm 0.4 b	3.26 \pm 0.22 C	22.0

R%: percent recovery of dialysate with respect to coffee. Different letters (a > b > c > d > e to coffee, or A > B > C > D to dialysates) in the same column indicate significant differences ($P < 0.05$).

Table 2. Polyphenols identified in coffee samples.

N°	RT (min)	Abreviature	Compound	Molecular formula	[M-H] ⁻ (m/z) experimental	[M-H] ⁻ (m/z) calculated	error (ppm)	MS ² (m/z)	λ _{máx} (nm)
1	7,2	QA*	Quinic acid	C7H11O6	191.0565	191.0561	-1.9	-	223
2	11,2	3-CQA	3-O-caffeoylquinic acid	C16H17O9	353.0883	353.0878	-1.5	179, 191, 173	227, 288sh, 321
3	11,6	4-CQA	4-O-caffeoylquinic acid	C16H17O9	353.0887	353.0878	-2.5	191, 179	228, 292sh, 326
4	12,2	1-FQA	1-O-feruloylquinic acid	C17H19O9	367.1039	367.1035	-1.2	193, 173	-
5	12,2	cis5-CQA	putative cis-5-O-caffeoylquinic acid	C16H17O9	353.0893	353.0878	-4.1	191, 179, 173	227, 289sh, 325
6	12,6	5-CQA*	5-O-caffeoylquinic acid	C16H17O9	353.0887	353.0878	-2.6	191, 179, 173	230, 301sh, 326
7	12,7	3-FQA	3-O-feruloylquinic acid	C17H19O9	367.1045	367.1035	-2.9	193	-
8	13,8	4-FQA	4-O-feruloylquinic acid	C17H19O9	367.1043	367.1035	-2.3	173, 191, 193, 335	229, 325
9	13,8	CQL	Caffeoylquinic lactone	C16H15O8	335.0798	335.0772	-7.7	161, 173, 179	229, 325
10	13,9	5-CoQA	5- <i>p</i> -coumaroylquinic acid	C16H17O8	337.0905	337.0929	7.1	191, 173	-
11	14,1	5-FQA	5-O-feruloylquinic acid	C17H19O9	367.1064	367.1035	-7.9	191, 173	228, 326
12	14,2	CA*	Caffeic acid	C9H7O4	179.0353	179.0350	-1.8	-	225, 300sh, 325
13	14,6	3-diMCiQA	3-O-dimetoxycinamoylquinic acid	C18H21O9	381.1187	381.1191	1.2	207, 337	-
14	15,2	3,4-diCQA	3,4-O-dicaffeoylquinic acid	C25H23O12	515.1207	515.1195	-2.2	353, 179, 173	226, 292sh, 323
15	16,0	3-FQL	3-O-feruloylquinic lactone	C17H17O8	349.0933	349.0929	-1.3	175, 193	227, 287sh, 317
16	17,1	4-diMCiQA	4-O-dimetoxycinamoylquinic acid	C18H21O9	381.1192	381.1191	-0.1	173, 207, 337	226, 285, 320
17	17,5	5-diMCiQA	5-O-dimetoxycinamoylquinic acid	C18H21O9	381.1192	381.1191	-0.3	173, 207, 193	226, 288, 317
18	17,8	CoCQA	Coumaroyl,caffeoylquinic acid	C25H23O11	499.1280	499.1246	-6.9	191, 173, 353, 311	226, 287sh, 322
19	17,8	FA*	Ferulic acid	C10H9O4	193.0501	193.0506	2.8	-	226, 291sh, 322
20	18,1	3,4-CFQA	3-O-caffeoyl, 4-O-feruloylquinic acid	C26H25O12	529.1360	529.1351	-1.6	367, 173, 335, 179, 193	226, 300sh, 327
21	18,2	4,5-diCQA	4,5-O-caffeoylquinic acid	C25H23O12	515.1201	515.1195	-1.1	353, 173, 179	226, 294sh, 324
22	20,3	diFQA	diferuloylquinic acid	C27H27O12	543.1523	543.1508	-2.9	349, 193, 367, 173	-
23	20,7	4,5-CFQA	4-O-caffeoyl, 5-O-feruloylquinic acid	C26H25O12	529.1364	529.1351	-2.4	353, 367, 173, 179, 191	227, 287sh, 320
24	21,3	CT	Caffeoyl tryptophan conjugated	C20H17N2O5	365.1144	365.1143	-0.4	229, 186, 203, 161	226, 286, 317
25	22,2	diCQL	putative dicaffeoylquinic lactone	C25H21O11	497.1128	497.1089	-7.7	335	226, 283sh, 319
26	22,9	CoT	Coumaroyl tryptophan conjugated	C20H17N2O4	349.1184	349.1194	2.7	229, 186, 203	226, 282, 316
27	23,1	FT	Feruloyl tryptophan conjugated	C21H19N2O5	379.1286	379.1299	3.7	203, 229	227, 281, 318

RT, retention time; [M-H]⁻ (m/z), negatively charged molecular ion; M² (m/z), daughter ions produced from [M-H]⁻ fragmentation; λ_{max}, maximum absorbance for compound identification by UV-VIS spectra; sh, shoulder. Compounds marked with * were identified and quantified using authentic standards. Other compounds are tentatively proposed based on RT, accurate MS and MS/MS in according to data from the literature.

Table 3. Polyphenolic compounds identified in coffee samples before *in vitro* digestion and after dialysis. Values (mg standard/100g sample) are reported as means \pm SD.

	Regular coffee			Arabic coffee			Green and roasted coffee blend			Chicory and coffee blend			Decaffeinated coffee		
	Coffee	Dialysate	R%	Coffee	Dialysate	R%	Coffee	Dialysate	R%	Coffee	Dialysate	R%	Coffee	Dialysate	R%
QA ¹	1700 \pm 230a	810 \pm 80A	48	1440 \pm 230b	780 \pm 100A	54	1314 \pm 24b	708 \pm 18B	54	576 \pm 4c	431.6 \pm 1.7C	75	1700 \pm 300a	800 \pm 80A	47
3-CQA	92 \pm 12b	< LOD	0	104 \pm 14a	< LOQ	0	98.7 \pm 0.5a	< LOQ	0	26.6 \pm 0.3d	< LOD	0	77 \pm 3c	< LOD	0
4-CQA	550 \pm 120b	16.9 \pm 1.1C	3,1	720 \pm 140a	18.1 \pm 0.6B	2,5	787 \pm 16a	20.60 \pm 0.11A	2,6	136.0 \pm 1.9d	16.7 \pm 0.4C	12	460 \pm 40c	16.7 \pm 0.9C	3,6
1-FQA	28 \pm 4a	< LOD	0	25 \pm 4b	< LOD	0	21.0 \pm 0.3c	< LOD	0	13.55 \pm 0.09d	< LOD	0	25 \pm 3b	< LOD	0
cis5-CQA	134 \pm 10b	8 \pm 8C	6,0	134 \pm 13b	15.43 \pm 0.23B	12	145 \pm 4a	15.63 \pm 0.25B	11	38.4 \pm 1.1d	16.06 \pm 0.21A	42	111 \pm 9c	10 \pm 8C	9
5-CQA	1050 \pm 200c	19.7 \pm 1.9C	1,9	1340 \pm 240b	23.1 \pm 1.7B	1,7	1549 \pm 19a	32.40 \pm 0.25A	2,1	352.9 \pm 0.3e	18.7 \pm 0.3C	5,3	940 \pm 100d	19.4 \pm 2.1C	2,1
3-FQA	280 \pm 80a	16.0 \pm 0.5A	5,7	250 \pm 90b	16.0 \pm 0.5A	6,4	195.2 \pm 1.7b	16.09 \pm 0.17A	8,2	104.1 \pm 1.9c	16.1 \pm 0.5A	16	220 \pm 60b	15.67 \pm 0.21B	7,1
4-FQA	110 \pm 30a	15.85 \pm 0.22A	14	90 \pm 40b	15.8 \pm 0.4A	18	49.5 \pm 0.5c	15.61 \pm 0.24B	32	46.5 \pm 1.2d	16.1 \pm 0.5A	35	69 \pm 16b	15.90 \pm 0.12A	23
CQL	430 \pm 210b	< LOQ	0	740 \pm 140a	< LOQ	0	674 \pm 16a	< LOQ	0	233.8 \pm 0.5c	< LOQ	0	220 \pm 90c	< LOD	0
5-CoQA	90 \pm 22c	18.9 \pm 1.2B	21	120 \pm 23b	20.7 \pm 0.6A	17	136.7 \pm 1.9a	20.6 \pm 0.5A	15	33.9 \pm 0.8e	16.7 \pm 0.3C	49	51 \pm 12d	17.2 \pm 1.0C	34
5-FQA	1150 \pm 250b	19.0 \pm 1.1B	1,6	1000 \pm 300b	19.9 \pm 2.5B	2	1327 \pm 6a	20.89 \pm 0.20A	1,6	429 \pm 7d	18.23 \pm 0.18C	4,2	660 \pm 90c	17.3 \pm 0.4D	2,6
CA ²	19 \pm 7a	< LOQ	0	17.2 \pm 1.8a	6.4 \pm 0.4B	37	14.77 \pm 0.12b	6.97 \pm 0.12A	47	4.131 \pm 0.014d	< LOD	0	13.7 \pm 1.8c	< LOQ	0
3-diMCiQA	24 \pm 15a	< LOQ	0	18.2 \pm 1.2a	15.39 \pm 0.23	85	15.54 \pm 0.08a	< LOQ	0	< LOD b	< LOD	0	19 \pm 7a	< LOQ	0
3,4-diCQA	120 \pm 40c	< LOD	0	168 \pm 23b	< LOD	0	466 \pm 6a	16.04 \pm 0.25	3,4	28.4392 \pm 0.0006e	< LOD	0	89 \pm 15d	< LOD	0
3-FQL	79 \pm 23b	< LOD	0	108 \pm 19a	< LOD	0	65.5 \pm 0.3c	< LOD	0	65.90 \pm 0.13c	< LOD	0	70 \pm 30c	< LOD	0
4-diMCiQA	24 \pm 16a	< LOQ	0	16.9 \pm 1.0a	< LOQ	0	14.69 \pm 0.12b	< LOQ	0	7.15 \pm 0.05c	< LOD	0	20 \pm 8a	< LOQ	0
5-diMCiQA	40 \pm 40a	< LOQ	0	26 \pm 4a	17.0 \pm 0.6A	65	19.53 \pm 0.11b	15.8 \pm 0.4B	81	8.49 \pm 0.4c	< LOD	0	29 \pm 16a	< LOQ	0
CoCQA	19.7 \pm 2.3c	< LOD	0	22.4 \pm 1.8b	< LOD	0	28.2 \pm 0.3a	< LOD	0	8.25 \pm 0.10e	< LOD	0	17.8 \pm 2.0d	< LOD	0
FA ³	90 \pm 30b	< LOD	0	130 \pm 60a	< LOD	0	146.0 \pm 1.4a	< LOD	0	68 \pm 4c	< LOD	0	90 \pm 40b	< LOD	0
3,4-CFQA	67 \pm 22b	< LOD	0	58 \pm 25b	< LOD	0	111.3 \pm 1.5a	< LOD	0	18.7 \pm 0.3d	< LOD	0	39.8 \pm 1.3c	< LOD	0
4,5-diCQA	140 \pm 50c	< LOD	0	180 \pm 60b	< LOD	0	675.4 \pm 0.6a	15.68 \pm 0.25	2,3	30.441 \pm 0.013e	< LOD	0	89 \pm 18d	< LOD	0
diFQA	32 \pm 16a	< LOD	0	29 \pm 6a	< LOD	0	23.4 \pm 0.6b	< LOD	0	10.7 \pm 0.3c	< LOD	0	21 \pm 5b	< LOD	0
4,5-CFQA	43 \pm 14b	< LOD	0	39 \pm 12b	< LOD	0	105.6 \pm 0.3a	< LOD	0	12.55 \pm 0.11d	< LOD	0	27.6 \pm 0.9c	< LOD	0
CT ²	160 \pm 40b	< LOD	0	120 \pm 70b	< LOD	0	287 \pm 4a	< LOQ	0	52.2 \pm 0.4d	< LOD	0	59 \pm 11c	< LOD	0
diCQL	19 \pm 3b	< LOD	0	23 \pm 4a	< LOD	0	21.25 \pm 0.03a	< LOD	0	8.16 \pm 0.11d	< LOD	0	16.2 \pm 1.6c	< LOD	0

CoT⁴	200 ± 60 ^a	40 ± 8 ^A	20	160 ± 110 ^b	30 ± 30 ^B	19	123 ± 8 ^b	30.9 ± 1.4 ^B	25	113.6 ± 0.6 ^b	33.4 ± 0.3 ^B	29	52 ± 16 ^c	22 ± 9 ^C	42
FT³	53 ± 8 ^b	< LOD	0	40 ± 30 ^c	< LOD	0	61.0 ± 0.6 ^a	< LOD	0	25.47 ± 0.12 ^c	< LOD	0	25 ± 4 ^c	< LOD	0

R%: percent recovery of dialysate with respect to coffee. Different letters (a > b > c > d > e to coffee, or A > B > C > D to dialysate) in the same row indicate significant differences ($P < 0.05$). All compound were quantified using 5-O-caffeoylquinic acid as reference compound, except: ¹quantified with quinic acid; ²quantified with caffeic acid; ³quantified with ferulic acid; ⁴quantified with *p*-coumaric acid. < LOD, below limit of detection. < LOQ, below limit of quantification. IDL = 4 mg/100g to 3-CQA, CQL, 3-diMCiQA, 3,4-diCQA, 4-diMCiQA, 5-diMCiQA, CoCQA, 3,4-CFQA, 4,5-diCQA, 4,5-CFQA and diCQL. IDL = 0.6 mg/100g to 1-FQA, 3-FQL, FA, diFQA and FT. IDL = 2 mg/100g to CA and CT. IQL = 15 mg/100g to 3-CQA, CQL, 3-diMCiQA, 4-diMCiQA and 5-diMCiQA. . IQL = 6 mg/100g to CA and CT.

Table 4. Antioxidant capacity (mmoles eq TROLOX/100g sample), for coffee samples before *in vitro* digestion and after dialysis.

	FRAP			TEAC			PHEN		
	coffee	dialysates	R (%)	coffee	dialysates	R (%)	coffee	dialysates	R (%)
RC	71 ± 7 a	14.7 ± 0.9 B	20.7	133 ± 11 a	27 ± 4 B	20.3	113 ± 18 a	22 ± 9 B	19.5
AC	76 ± 12 a	13.8 ± 1.3 B	18.2	132 ± 18 a	23.4 ± 0.7 C	17.7	124 ± 15 a	28 ± 4 B	22.6
GRC	65.5 ± 1.7 b	17.20 ± 0.08 A	26.2	121 ± 4 b	33.3 ± 1.1 A	27.5	112 ± 6 a	40 ± 3 A	35.7
CC	42.1 ± 1.0 d	6.88 ± 0.19 D	16.3	72.3 ± 2.4 c	11.5 ± 0.9 E	15.9	66 ± 3 c	8.4 ± 0.4 C	12.7
DC	61 ± 8 c	10.5 ± 1.3 C	17.2	128 ± 9 a	22.7 ± 0.7 D	17.7	102 ± 14 b	24 ± 10 B	23.5

R%: percent recovery of dialysate with respect to coffee. Different letters (a > b > c to coffee, or A > B > C to dialysates) in the same column indicate significant differences ($P < 0.05$).

Table 5. Adjusted parameters, performance, and relative influence (%) of Boosted Regression Trees models for antioxidant capacity (FRAP, TEAC and PHEN) of coffee samples before *in vitro* digestion and after dialysis.

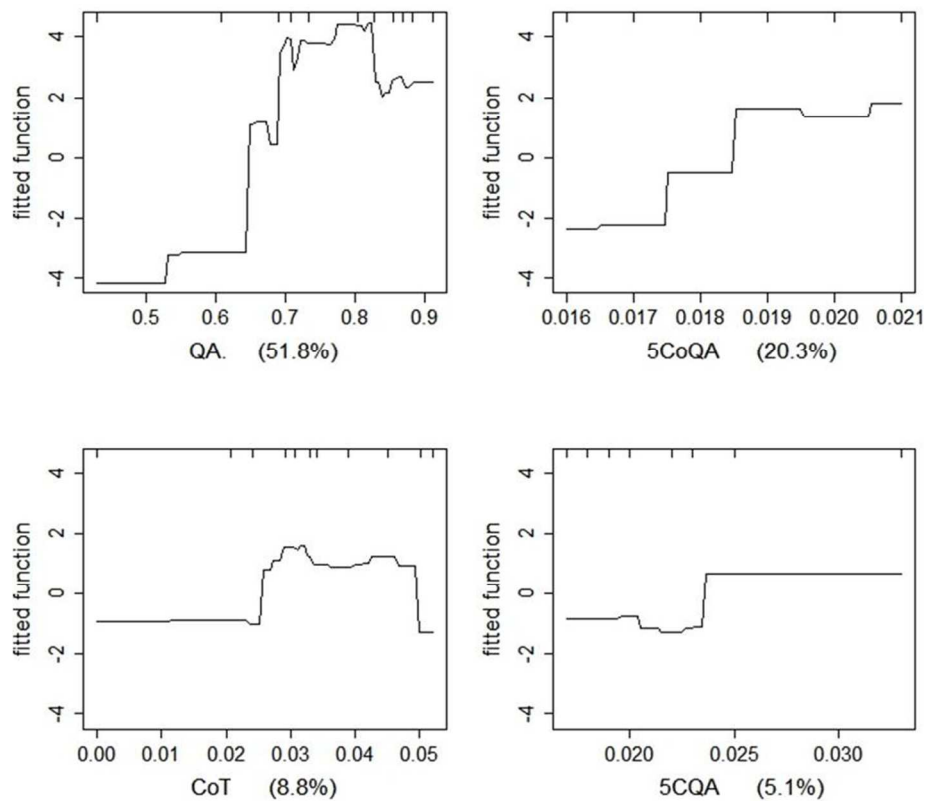
	Coffee			Dialysates		
	TEAC	FRAP	PHEN	TEAC	FRAP	PHEN
<i>Adjusted parameters</i>						
bag fraction	0.55	0.55	0.50	0.55	0.60	0.60
learning rate	0.0006	0.0008	0.0006	0.001	0.0006	0.0005
tree complexity	2	2	2	2	2	2
<i>Model performance</i>						
CV correlation	0.969	0.979	0.926	0.985	0.970	0.982
optimal number of trees	48,250	39,500	29,750	38,250	32,250	60,500
<i>Relative influence of polyphenols (%)</i>						
QA	9.5	3.4	5.6	51.8	20.9	10.0
3-CQA	2.0	2.9	2.0	-	-	-
4-CQA	4.5	1.0	2.0	8.9	0.3	0.7
1-FQA	7.3	3.8	2.4	-	-	-
cis5-CQA	0.8	0.4	0.8	2.7	1.5	12.8
5-CQA	9.2	3.0	12.3	5.1	2.3	14.3
3-FQA	13	2.5	1.9	1.1	2.1	2.2
4-FQA	15.9	2.7	2.3	0.3	1.9	0.6
CQL	5.6	27.3	30.1	-	-	-
5-CoQA	1.1	5.3	2.8	20.3	45.3	37.6
5-FQA	1.0	0.8	1.1	1.0	15.5	1.4
CA	0.8	0.5	0.7	-	-	-
3-diMCiQA	0.4	0.4	0.6	-	-	-
3,4-diCQA	1.4	3.1	5.1	-	-	-
3-FQL	1.8	5.2	5.3	-	-	-
4-diMCiQA	0.3	0.3	0.3	-	-	-
5-diMCiQA	0.2	0.3	0.6	-	-	-
CoCQA	0.1	0.1	1.1	-	-	-
FA	2.5	2.9	2.1	-	-	-
3,4-CFQA	1.6	3.0	5.3	-	-	-
4,5-diCQA	0.4	0.2	1.1	-	-	-
diFQA	4.4	0.8	0.7	-	-	-
4,5-CFQA	0.4	0.5	1.6	-	-	-
CT	11.6	1.7	1.5	-	-	-
diCQL	0.2	3.8	4.7	-	-	-
CoT	2.3	13.4	3.6	8.8	10.3	20.3

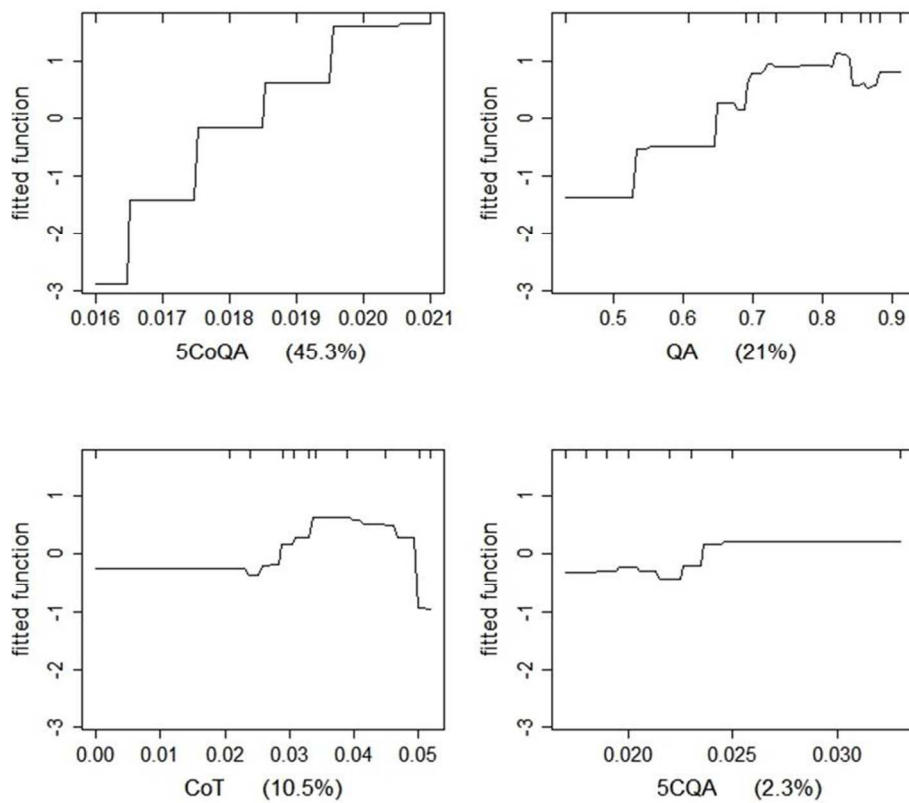
FT	1.7	10.7	2.1	-	-	-
<i>Cumulative influence (%)</i>	100	100	100	100	100	100

FIGURE GRAPHICS

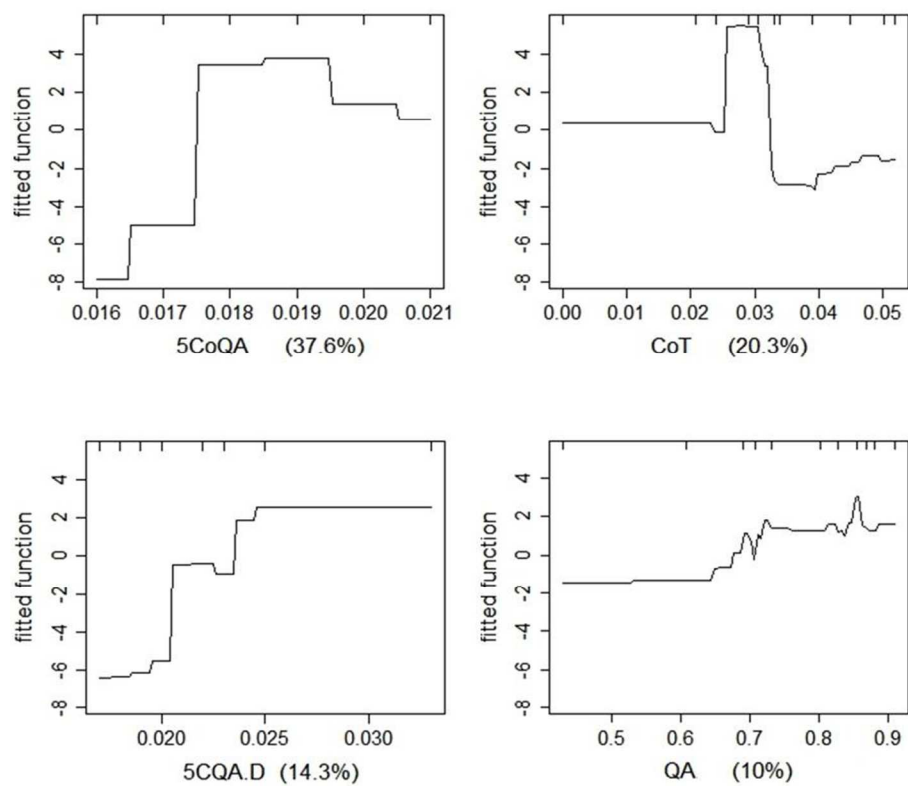
Figure 1.

A



B

C



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