

# 1 Permittivity Measurements for Roasted Ground Coffee Versus 2 Temperature, Bulk Density, and Moisture Content

3 Rafael Pérez-Campos<sup>1\*</sup>, José Fayos-Fernández<sup>1</sup> and Juan Monzó-Cabrera<sup>1</sup>

4 <sup>1</sup>*Departamento de Tecnologías de la Información y las Comunicaciones, Universidad*  
5 *Politécnica de Cartagena, Cartagena, Spain*

6 *\*Email: rafael.perez@upct.es*

7 **Abstract:** For a large variety of food products, the moisture content can be  
8 indirectly determined by measuring their dielectric properties. In the case of coffee,  
9 the permittivity knowledge can be applied to determine the moisture content  
10 indirectly or for online moisture meters in automatic control of coffee dryers.  
11 However, there is little data on the dielectric properties of roasted ground coffee  
12 near the 2.45 GHz ISM band. In this contribution, the permittivity was measured  
13 versus temperature, bulk density, and moisture content. A resonant technique based  
14 on a coaxial microwave cavity was employed to obtain the complex permittivity as  
15 a function of those magnitudes near the 2.45 GHz ISM band. In addition, the  
16 permittivity of the coffee particle kernel has been estimated from a complex  
17 refractive index mixture equation, thus calculating the permittivity of the coffee  
18 particle kernel from the permittivity values of the mixture air-coffee (ground coffee)  
19 at different bulk densities. The results showed that both dielectric constant and loss  
20 factor increase for increasing temperature, bulk density, and moisture content  
21 values. Furthermore, expressions fitting the experimental data were provided,  
22 thereby facilitating the estimation of the values throughout the studied temperature,  
23 bulk density, and moisture content ranges.

24 **Keywords:** coffee; microwave; resonant technique; dielectric constant; loss  
25 factor; kernel permittivity

## 26 Introduction

27 The response of the matter exposed to electromagnetic fields is characterized by its  
28 dielectric properties. These are quantified by the complex relative permittivity ( $\epsilon_r$ ) defined  
29 by equation (1), which is the absolute permittivity normalized to the permittivity of free  
30 space ( $\epsilon_0 = 8.854 \cdot 10^{-12}$  F/m).

$$31 \quad \epsilon_r = \epsilon'_r - j \cdot \epsilon''_r \quad (1)$$

32 where  $\epsilon'_r$  is the dielectric constant and  $\epsilon''_r$  is the loss factor. The quantity of electric energy  
33 that may be stored inside the irradiated material is determined by the dielectric constant,  
34 which is not constant due to its dependence on moisture content (MC), temperature,  
35 frequency, and bulk density. The loss factor describes the material's capacity to convert  
36 microwave radiation into heat, and it is variable with regard to some parameters, as the  
37 dielectric constant is.

38 The dielectric properties of vegetable materials can be used to estimate their MC e.g.,  
39 cherry leaves (Dogan et al. 2020), orange and lemon leaves (Genç et al. 2020), or cypress  
40 and rockrose (Pérez-Campos et al. 2020). The MC determination becomes crucial as it  
41 helps determine the physical properties of materials such as maize (Barnwal 2012), or

42 coffee (Nakilcioğlu-Taş 2019).

43 Coffee is one of the most well-known and traded commodities on a worldwide scale,  
44 valued for its scent and caffeine content. The chemical composition of the roasted beans  
45 determines the quality of coffee used in beverages. As a matter of fact, the distinctive  
46 coffee flavor is the consequence of the interaction of hundreds of chemical compounds  
47 created by roasting processes (Rodrigues et al. 2002).

48 One of the primary priorities of current commercial coffee producers and coffee  
49 researchers is to enhance product quality, and this is indirectly accomplished by regularly  
50 measuring its moisture content (Gautz et al. 2008). The state of the product must be  
51 assessed during all the actions associated with coffee manufacturing in order to preserve  
52 its original quality. The drying stage is considered the most crucial operation in the  
53 harvesting to roasting sequence of coffee processing (Ghosh and Venkatachalapathy  
54 2014), given that unappropriated drying is deemed as the major cause of the decay in  
55 coffee fragrance, flavor, and taste after brewing. Moreover, the drying of grains is one of  
56 the most energy-intensive processes in agriculture (Forbes et al. 1984; Ghosh and  
57 Venkatachalapathy 2014). Still, this quality assessment relies on time-consuming and  
58 costly artisanal tools or procedures.

59 Despite the advancement of new techniques for rapid and non-destructive prediction of  
60 moisture content (MC) in coffee (Adnan et al. 2017; Setiasih et al. 2019; Tugnolo et al.  
61 2021), the development of an on-line moisture meter capable of providing excellent  
62 readings under continuous flow circumstances is an ongoing issue for coffee drying  
63 technology (Berbert et al. 2001).

64 Several methods have been researched with various food products for a similar purpose.  
65 Porzuczek presented a method using electrical impedance tomography over a frequency  
66 range of 20 Hz to 200 kHz for the online determination of the spatial distribution of the  
67 MC in granular material (Porzuczek 2019). Nevertheless, there are still certain issues with  
68 this technique that need to be resolved, including the need for a suitable contact between  
69 the material and the electrodes as well as the long-term stabilization of the measurement  
70 result. Kandala et al. employed a simple impedance meter and a capacitance sensor to  
71 estimate the MC of corn samples (Kandala and Sundaram 2009) at frequencies of 1 and  
72 5 MHz.

73 However, many other authors opted for utilizing a dielectric model so as to predict the  
74 material MC given the relationship between the MC and the dielectric properties. Zeng  
75 et al. studied the moisture state and migration, inter alia, in ginger slices (Zeng et al.  
76 2022). They reached the conclusion that the MC and the dielectric properties were  
77 strongly related, with the biggest influence on the dielectric properties coming from free  
78 water. In another contribution, Kim et al. developed an online radio-frequency capacitive-  
79 type grain moisture meter that could determine the MC of several varieties of rice and  
80 wheat by measuring their dielectric properties (Kim et al. 2003).

81 The dielectric response has been studied for MC detection (Berbert et al. 2001), as well  
82 as the description of water features in green and roasted coffee (Iaccheri et al. 2015).  
83 Berbert et al. (2001) studied the permittivity behaviour of three varieties of parchment  
84 coffee, for frequencies ranging from 75 kHz to 5 MHz. They also demonstrated how its  
85 permittivity varies with MC and bulk density. Finally, they concluded that the relative  
86 permittivity should provide less inaccuracy in determining the MC of parchment coffee.  
87 The dielectric properties of four coffee stages have been presented in (Velasquez et al.  
88 2018) for frequencies ranging from 0.3 to 6 GHz, and the MC was estimated from the  
89 obtained complex permittivity.

90 Nevertheless, to the best of the authors' knowledge, there are no studies in the literature  
91 providing the permittivity of roasted ground coffee under various water content,  
92 temperature, and bulk density conditions. Furthermore, the permittivity of coffee granules  
93 is also estimated using well-known equations and data from the literature, as well as bulk-  
94 density dependent observations.

95 There are many methods to acquire the dielectric properties of any type of material (Icier  
96 and Baysal 2004). In general, the selection of a measurement equipment is conditioned  
97 by the material, the required frequency range, and precision, as well as the equipment's  
98 price.

99 The open-ended coaxial probe, transmission line, and resonant cavity methods are the  
100 three most prevalent methods for testing dielectric properties in foods and commodities.  
101 The coaxial probe approach provides broadband measurements, and it is very easy to use  
102 given that it does not require a certain sample shape (Lau et al. 2020). Its main drawback  
103 is its limited accuracy, especially for low-loss materials. In addition to that, solids must  
104 have a flat surface for a proper measurement.

105 In the transmission line method, the sample is inserted as a section inside a well-defined  
106 transmission line. This method is usually more precise and sensitive than the probe  
107 method, but its handling is more complex and requires longer operating times.  
108 Furthermore, the measurement accuracy can be severely degraded if the sample does not  
109 precisely fill the transmission line cross-section uniformly.

110 Finally, the resonant cavity approach is based on a differential response analysis over the  
111 perturbation produced by a sample on a single-mode resonance electromagnetic pattern,  
112 that is the shifting of the resonant frequency (determines the dielectric constant) and the  
113 alteration of the quality factor (determines the loss factor) of the cavity. This method  
114 offers high accuracy, and it is well-suited for samples with low loss factor values.  
115 Nevertheless, it only provides the complex permittivity at a single frequency conditioned  
116 by the cavity resonance. The selected device for the measurements in this study is based  
117 on a resonant technique that provides results around 2.45 GHz (Gutiérrez et al. 2019).

## 118 **Materials and Methods**

### 119 ***Material***

120 Roasted ground coffee (*Coffea arabica*) was utilized for the tests, produced by UCC  
121 Coffee Spain S.L. and commercially accessible at a well-known Spanish supermarket  
122 chain. As stated in (Gutierrez et al. 2019), sample containers must be able to fit through  
123 the endplate hole and deeper into the center conductor within the cavity to provide  
124 concentric alignment. The cylindrical geometry of samples is a requisite for obtaining  
125 accurate results, which are conditioned by the cylindrical cavity geometry and the  
126 resonant electromagnetic pattern that it produces. Hence, 6-ml quasi-cylindrical  
127 polypropylene test tubes (Deltalab Ref. 400400) were used as sample containers. The test  
128 tubes' internal diameter and height were 10.3 mm and 86.9 mm, respectively.

129 Table 1 shows the coffee mass of samples utilized for the three permittivity  
130 measurements. The starting conditions of the samples for the temperature, bulk density,  
131 and MC relationships examined in this work are also presented in the table.

**Table 1.** Coffee samples conditions for each permittivity measurement test

Dependence analysis test	No. of samples	Mass (g)	Temperature (°C)	Bulk density (kg/m <sup>3</sup> )	MC (%)
Temperature	4	1.69 ± 0.04	[29-87]	371 ± 5	4.8 ± 0.2
Bulk density	3	1.40 ± 0.01	24 ± 2	[310-420]	4.8 ± 0.2
MC	4	1.69 ± 0.04	24 ± 2	363 ± 5	[0-4.8]

### 132 *Particle Size Measurement Equipment*

133 The particle size distribution was determined using a Mastersizer 2000 analyser (Malvern  
134 Instruments) with distilled water as the dispersant medium. Laser diffraction is used to  
135 determine particle size. The intensity of light scattered by particles as it passes through  
136 the sample is measured to accomplish this. Large particles scatter light strongly at narrow  
137 angles, whereas small particles scatter light weakly at wider angles.

### 138 *Permittivity Measurement Equipment*

139 When selecting the appropriate measuring method to determine the permittivity of  
140 materials, it is important to take into consideration several factors, including the geometry  
141 and format of the material and how to adapt it into a holder suitable for the measuring  
142 technology, a prediction of its electrical losses, and how to configure other parameters of  
143 interest (e.g., frequency, temperature, bulk density, moisture content). Since it was  
144 anticipated that coffee would have low electrical losses, and keeping in mind the  
145 measurement requirements (e.g., preparation and handling of samples, measurement  
146 repeatability and accuracy, temperature monitoring, frequency), the transmission line  
147 method as waveguide measurement kits, as well as the parallel plate and open-ended  
148 coaxial probe methods, were discarded. The resonant coaxial bi-reentrant microwave  
149 cavity described in (Gutiérrez-Cano, 2019), in which the substance being tested is housed  
150 in a vial, allows for easy temperature monitoring using a regular optical fiber temperature  
151 sensor while the permittivity is measured. The handling of granular samples in test tubes  
152 simplifies the measurement protocol. In addition, this cavity is commercially available,  
153 thereby ensuring the reproducibility of this study.

154 The relative electric permittivity measurements were conducted using a Dielectric Kit for  
155 Vials (DKV), from ITACA research institute of Universidad Politécnica de Valencia  
156 (Spain). This device sends a microwave frequency-swept stimulus into a resonant cavity  
157 and measures the reflected power. Before measuring the response of the cavity loaded  
158 with the sample, the empty cavity must be calibrated. The resonance frequency variation  
159 of the response signal i.e., the displacement of its peak location, and its widening due to  
160 a decrease in the cavity quality factor when a dielectric material is inserted into its  
161 resonant structure (Sheen 2009) are computed to determine the dielectric constant and  
162 loss factor of liquid, granular, or powdered materials around 2.45 GHz. As mentioned in  
163 (Gutiérrez et al. 2019), the connection between complex permittivity and resonance  
164 characteristics is derived using numerical approaches based on mode-matching and  
165 circuit analysis.

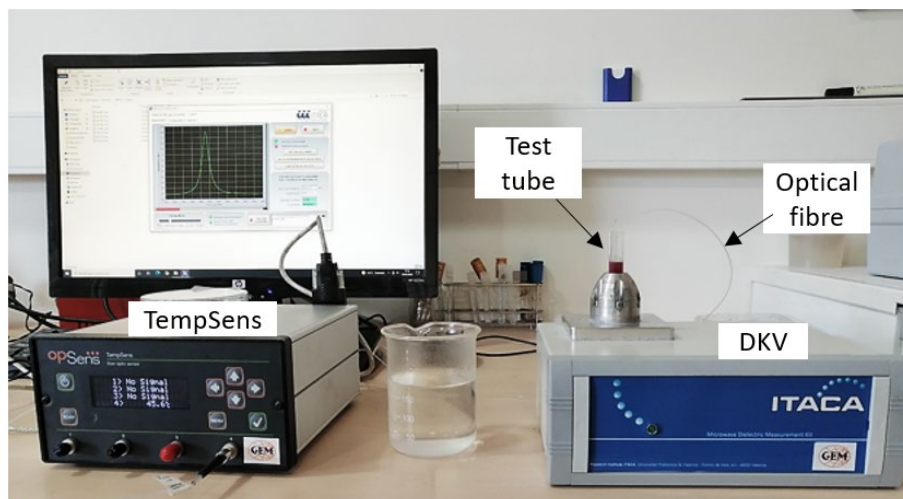
166 The DKV's operating frequency spans from 1.5 to 2.6 GHz. It has the ability to  
167 characterize materials with dielectric constants of less than 100 and loss factors ranging  
168 from 0.001 to 15. This equipment provides a 1% and 5% error in determining the  
169 dielectric constant and the loss factor, respectively. The manufacturer's repeatability and  
170 linearity values are about 0.2 percent.

171 The coffee samples had resonance frequencies of  $2.40 \pm 0.10$  GHz. As a result, the  
172 relative electric permittivity data presented at various temperature, MC, and bulk density  
173 conditions is close to the 2.45 GHz ISM band.

#### 174 ***Measurement Procedure for Temperature Dependence of Coffee Permittivity***

175 The permittivity of roasted ground coffee as a function of temperature was measured in a  
176 manner similar to that employed in (Pérez-Campos et al. 2020). The temperature  
177 evolution of the sample was tracked using an optical fiber sensor and OpSens TempSens  
178 signal conditioner equipment. For temperatures above and below  $45^\circ\text{C}$ , the TempSens  
179 has an accuracy of  $0.8^\circ\text{C}$  and  $0.3^\circ\text{C}$ , respectively.

180 The procedure for measuring the permittivity as a function of temperature is shown in  
181 figure 1. Initially, each sample was heated in a water bath (Balneum Mariae) to almost  
182  $90^\circ\text{C}$  using a 150 mL glass of water pre-heated in a household microwave oven. The  
183 heated sample was then placed in the DKV apparatus to be monitored its permittivity  
184 while cooling. The temperature over time  $T(t)$  logging was performed on a computer  
185 connected to the TempSens equipment using an in-house LabView code. Simultaneously,  
186 the DKV manufacturer's instrument software was utilized to log the sample permittivity  
187 over time  $\epsilon_r(t)$ . Finally, both datalogs are combined by means of a Matlab script, therefore  
188 providing the permittivity dependence on temperature  $\epsilon_r(T)$ , as stated in (Fayos-  
189 Fernandez et al. 2015).



190  
191 **Fig. 1.** Methodology and setup for measuring the complex permittivity dependency on  
192 temperature.

193 Every sample was measured once. The average of each samples set with a discretized  
194 resolution of  $\Delta T=1^\circ\text{C}$  was used to compute the modelled discrete-temperature  
195 dependency of the permittivity data i.e., the permittivity values recorded within the same  
196 temperature bin  $T \pm \Delta T/2$  were averaged. As a result, the first discrete-temperature was set  
197 to  $87^\circ\text{C}$ , matching the bin limits of  $[86.5, 87.5]^\circ\text{C}$ , while the last discrete-temperature was  
198 set to  $29^\circ\text{C}$ , matching the bin boundaries of  $[28.5, 29.5]^\circ\text{C}$ .

199 As indicated in table 1, the MC and bulk density were kept constant throughout the tests.

#### 200 ***Test Protocol for Coffee Permittivity Variation Versus Bulk Density***

201 Another experiment carried out in this paper was evaluating the permittivity dependence  
202 on bulk density. The mass of the coffee samples remained unchanged, as shown in table 1,  
203 while the volume was lowered from  $4.4$  to  $3.4 \text{ cm}^3$ . The mass sample was measured using

204 a Mettler Toledo weighing scale, model XPR56DR, with an accuracy of 0.01 mg. As  
205 described in (Fayos-Fernández et al. 2018), the sample volume was obtained using an in-  
206 house volumeter developed with a parallax error control.

207 The findings of permittivity in function of bulk density were computed as the average of  
208 three samples set per bulk density value. The average dry-basis MC of the coffee samples  
209 used in these density-dependent assays was roughly 5 %. The sample temperature  
210 matched the room temperature throughout all bulk density-dependent observations, as  
211 previously indicated in table 1.

### 212 ***Measurement Procedure for Moisture Content-Dependent Permittivity***

213 In this study, the dielectric properties of roasted ground coffee were investigated in  
214 relation to MC. Four coffee samples were generated. The samples were then progressively  
215 dried in a muffle furnace at 90°C for 2 hours at a time. After each drying interval, the  
216 samples were extracted and cooled to their ambient temperature. The amount of  
217 evaporated water was determined by weighing the samples on a Mettler Toledo weighing  
218 scale (model XPR56DR) and measuring their dielectric properties in the DKV.

219 Because of the weighing scale's high precision (0.01 mg), slight mass decrements were  
220 consistently identified between two consecutive readings. As a result, the treatment was  
221 declared complete when mass changes were less than 5 mg across two consecutive weigh-  
222 ins. This criterion is supported by the fact that no permittivity fluctuation was identified  
223 between the two most recent observations. The most recent mass sample collected was  
224 used as the dry mass reference.

225 As indicated in equation (2), the MC used in this study has been represented as a dry  
226 basis:

$$227 \quad MC = \frac{m_i - m_d}{m_d} \quad (2)$$

228 where  $m_i$  and  $m_d$  denote the sample mass at a certain MC and the sample mass when  
229 totally dried. As a result,  $MC$  is the ratio of the water mass in the coffee granules to the  
230 dried solid mass, because  $m_i - m_d$  indicates the water mass in the sample. Averaging the  
231 observations from four distinct samples yielded the results of the MC-dependent complex  
232 permittivity values.

### 233 ***Calculations for Estimating Coffee Particle Kernel Permittivity***

234 Granular and powdered materials, such as ground coffee, are composed of granular  
235 kernels and air that fills the space between them. When measuring the permittivity of  
236 these materials in bulk, one have to take into consideration that the observed effective  
237 permittivity is the consequence of a combination of grain kernel and air permittivities. As  
238 a result, the measurement findings are affected by the bulk density of the granular or  
239 powdered material and hence it is critical to establish a reliable relationship between the  
240 air-kernel mixture's bulk density and the measured permittivity.

241 The permittivity-to-bulk density relationship of some granular and powdered materials  
242 has already been studied (Nelson 2005). Trabelsi et al. developed a calibration function  
243 independent of bulk density that permits permittivity measurements to be used to  
244 determine MC in granular materials (Trabelsi et al. 1998). In other investigations,  
245 researchers established the material's bulk density before studying its dielectric properties  
246 (Torrealba-Meléndez et al. 2015).

247 In this work, the permittivity of the coffee particle kernel is determined using the

248 dielectric mixture equations for a two-phase mixture, which calculates the permittivity of  
 249 a solid material (coffee particle) from the permittivity of a granular mixture (particle-air).  
 250 This requires knowledge of the permittivity of the air-powder combination, its bulk  
 251 density, and the coffee particle density. The real coffee particle density had been  
 252 previously calculated in (Nakilcioğlu-Taş and Ötleş 2019), whose value was 0.91 g/cm<sup>3</sup>.  
 253 In this study, the Complex Refractive Index (CRI) mixing equation for two-phase  
 254 mixtures (Nelson 2005) is used to calculate the permittivity of coffee particles,  $\varepsilon_c$  (see  
 255 equation 3).

$$256 \quad \sqrt{\varepsilon_m} = v_a \sqrt{\varepsilon_a} + v_c \sqrt{\varepsilon_c} \quad (3)$$

257 Where  $\varepsilon_m$ ,  $\varepsilon_a$  and  $\varepsilon_c$  are the air-coffee particle mixture's permittivity, the air permittivity  
 258 ( $\varepsilon_a = 1$ ) and the coffee particle permittivity, respectively. At the same time,  $v_a$  is the  
 259 volume fraction of air and  $v_c$  is that of coffee, so that  $v_a + v_c = 1$ . Both of these may be  
 260 calculated using the bulk density of the mixture ( $\rho_m$ ) and the coffee particle density ( $\rho_c$ )  
 261 e.g.,  $v_a = \frac{\rho_m}{\rho_c}$ .

262 As a result, equation (3) may be expressed using equations (4) and (5):

$$263 \quad \varepsilon'_c = \left[ \frac{\rho_c}{\rho_m} \left( \sqrt{\varepsilon'_m} - 1 \right) + 1 \right]^2 \quad (4)$$

$$264 \quad \varepsilon''_c = \left( \frac{\rho_c}{\rho_m} \right)^2 \cdot \varepsilon''_m \quad (5)$$

265 Where dielectric constant and the loss factor of the coffee particle are denoted by  $\varepsilon'_c$  and  
 266  $\varepsilon''_c$  respectively. Similarly,  $\varepsilon'_m$  is the dielectric constant for the mixture air-coffee and  
 267  $\varepsilon''_m$  its loss factor.

## 268 ***Statistical Analysis***

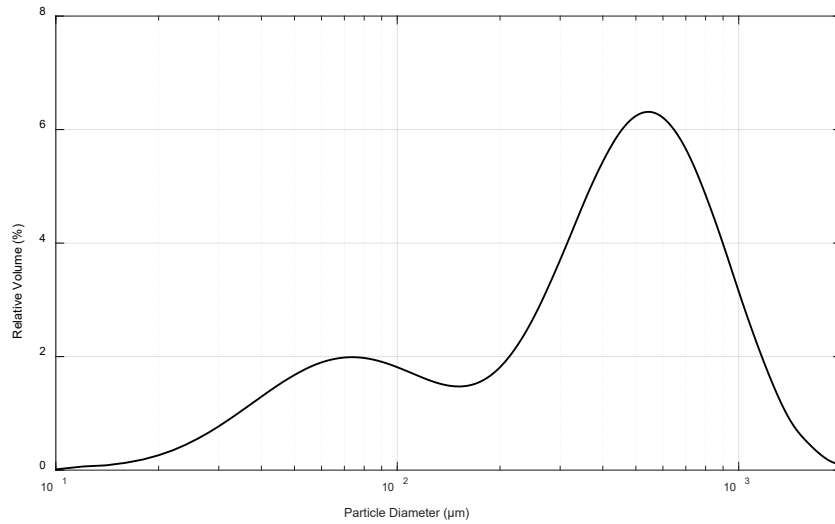
269 Every permittivity measurement was performed, at least, three times. To calculate error  
 270 bars for all data points, the standard deviation of the average value of triplicates (or  
 271 quadruplicates) was used. Matlab (version R2019a, MathWorks software) was used to  
 272 process and plot the data.

## 273 **Results**

274 In this section, the particle size distribution is shown as well as the dielectric properties  
 275 of roasted ground coffee are presented and discussed in relation to temperature, bulk  
 276 density, and MC. The estimated value for the coffee particle permittivity is also shown in  
 277 this section. For all the graphics showing permittivity experimental data, the dielectric  
 278 constant is depicted in blue, whereas the loss factor is represented in red. A dashed line  
 279 represents the data fittings.

## 280 ***Particle Size Distribution***

281 The particle size analysis results are shown in Figure 2. The particle size distribution of  
 282 coffee particle kernels was bimodal, with granule sizes (volume mean diameters) of about  
 283 0.5 mm. The findings showed that coffee particle kernels did not have a uniform particle  
 284 size distribution. The average size of particles was 423,1  $\mu\text{m}$ . These findings are similar  
 285 to those seen in the literature (Khamitova et al. 2020).



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**Fig. 2.** Particle size distribution of coffee particle kernels.

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### ***Permittivity Dependence on Temperature***

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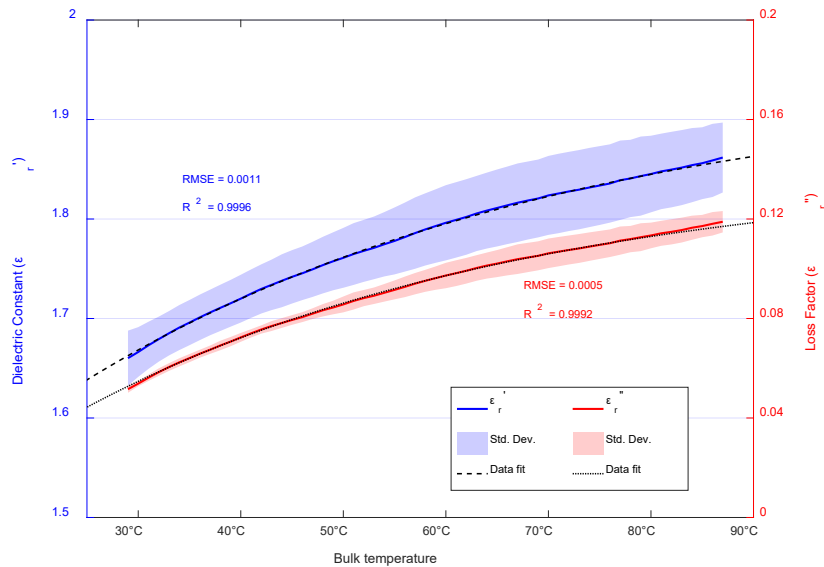
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Figure 3 depicts the average behaviour versus temperature of the dielectric constant and loss factor throughout a temperature range of 29 to 87°C. Figure 3 also shows the standard deviations of both magnitudes and their exponential fitting. The obtained findings show that the dielectric constant and loss factor increased by 13 and 142 % throughout the whole temperature range, respectively. A factor that could account for this rise is the mobility of water dipoles, which might be increased due to the lowering water density as temperature rises, suggesting that some free water is released from its bound state, thus raising the values of the dielectric constant and loss factor. The increase in conductivity in the solid matrix might be another factor explaining the observed behaviour of the dielectric properties. To test these assumptions, however, further research has to be conducted.



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301

302

**Fig. 3.** Coffee permittivity versus temperature and exponential data fitting.  
 $\rho_m = 0.37 \text{ g/cm}^3$ ,  $X = 4.8 \%$ .

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Equations (6) and (7) describe the exponential function applied for the dielectric constant and loss factor dependency on temperature data fittings, respectively:

$$\epsilon'_r(T) = 1.94 - 0.51 \cdot T^{-0.021} \quad (6)$$



306

$$\varepsilon''_r(T) = 0.14 - 0.17 \cdot T^{-0.023} \quad (7)$$

307

where  $T$  is the sample temperature in degrees Celsius. The dielectric constant's root mean square error (RMSE) and coefficient of determination ( $R^2$ ) are 0.0011 and 0.9996, respectively. The RMSE for the loss factor is 0.0005 and the  $R^2$  is 0.9992.

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### ***Permittivity Dependence on Bulk Density***

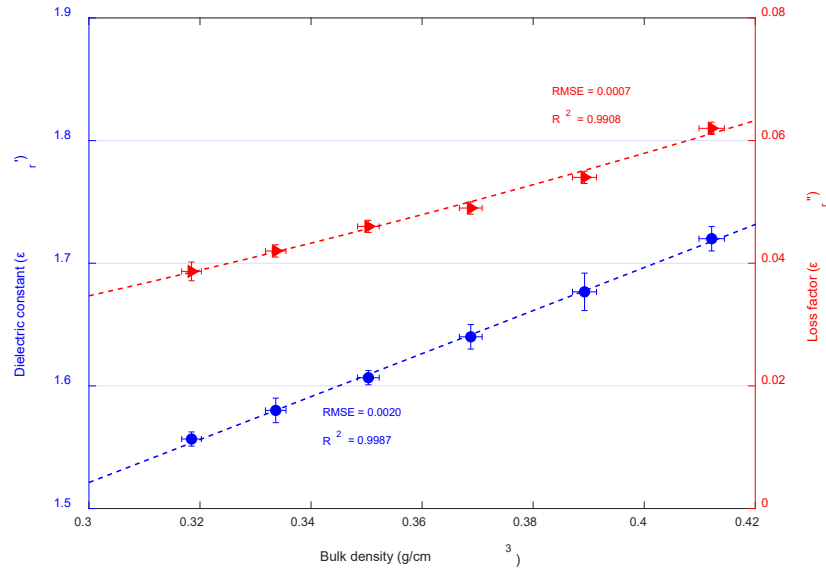
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Figure 4 depicts the average values of the dielectric constant and loss factor versus bulk density. Error bars are used to display standard deviation data. In terms of permittivity fluctuation, the dielectric constant increase for the studied range is roughly 10.5 %, and the loss factor increase is 60.3 %.

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**Fig. 4.** Coffee permittivity versus bulk density and polynomial data fitting.  $T = 24^\circ\text{C}$ ;  $X = 4.8\%$ .

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As a result, equations (8) and (9) were generated by fitting second-order polynomials to dielectric constant and loss factor data:

320

$$\varepsilon'_r(\rho_m) = 0.038 \cdot \rho_m^2 + 1.726 \cdot \rho_m + 1 \quad (8)$$

321

$$\varepsilon''_r(\rho_m) = 0.292 \cdot \rho_m^2 + 0.28 \cdot \rho_m \quad (9)$$

322

where  $\rho_m$  is the sample's bulk density ( $\text{g}/\text{cm}^3$ ). The RMSE and  $R^2$  for fitting the dielectric constant are 0.0020 and 0.9987, respectively. The RMSE and  $R^2$  for fitting the loss factor are 0.0007 and 0.9908, respectively.

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### ***Permittivity Dependence on Dry-Basis Moisture Content***

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Figure 5 depicts the development of the dielectric constant and loss factor as a function of dry-basis MC. Both the dielectric constant and the loss factor increase with rising MC levels. A possible reason for this behaviour is the fact that when MC grows, so does the amount of water and its mobility, and consequently the loss factor and the dielectric constant. However, different states of water (bound or free) can be perceived by observing the permittivity evolution. For MC values less than 1%, internal water tend to be highly linked to the internal structure of coffee tissue (bound water), resulting in reduced water mobility and very low loss factor values. This behaviour is similar to that found for ginger slices (Zeng et al. 2022): the amount of free water had the greatest influence on dielectric properties.

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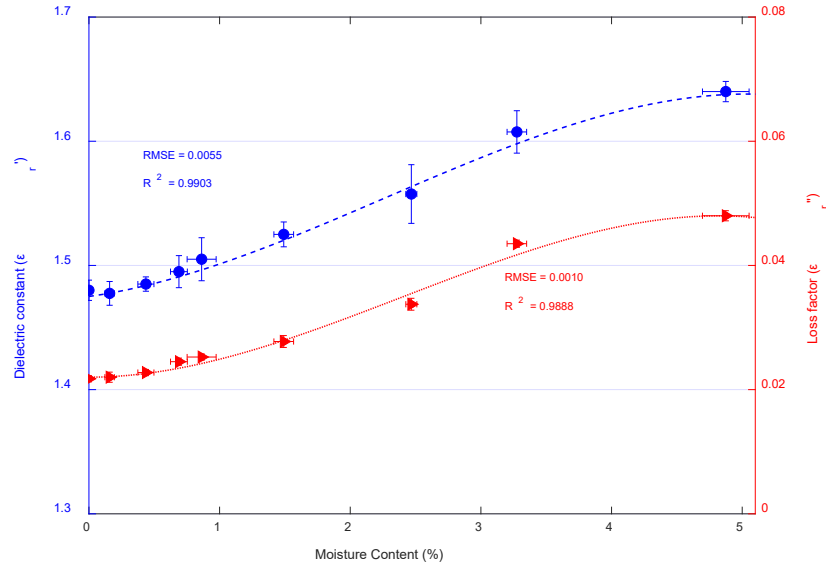
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**Fig. 5.** Coffee permittivity behaviour versus MC and polynomial data fitting.  
 $\rho_m = 0.36 \text{ g/cm}^3$ ;  $T = 24^\circ\text{C}$

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 338

339 Third order polynomial functions were employed to interpolate the experimental data of  
 340 permittivity development versus MC, as described by equations (10) and (11):

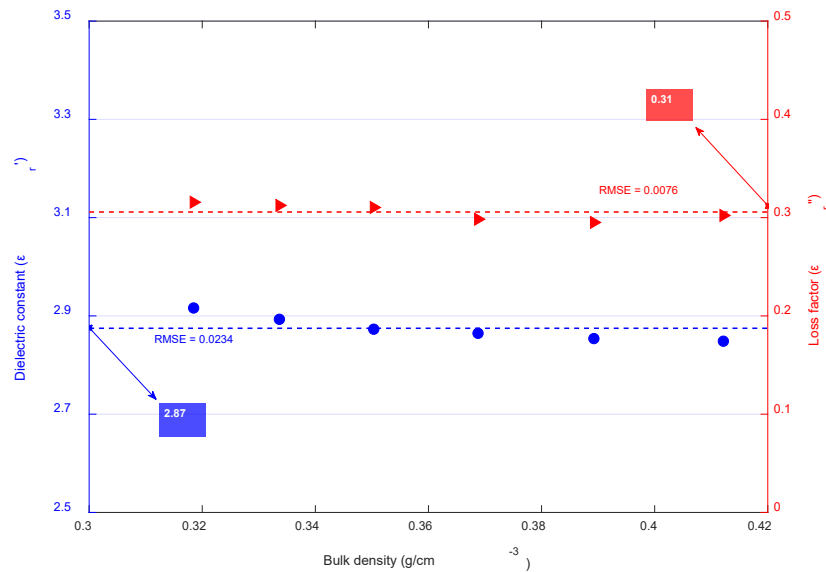
341 
$$\varepsilon'_r(MC) = 1.475 + 1.47 \cdot MC + 134.2 \cdot MC^2 - 1968 \cdot MC^3 \quad (10)$$

342 
$$\varepsilon''_r(MC) = 0.022 + 33.6 \cdot MC^2 - 465 \cdot MC^3 \quad (11)$$

343 where  $X$  is the predicted dry-basis MC from equation (5). The RMSE and  $R^2$  values for  
 344 fitting the dielectric constant were 0.0055 and 0.9903, respectively, whereas the RMSE  
 345 and  $R^2$  values for fitting the loss factor were 0.0010 and 0.9888, respectively.

346 ***Coffee Particle Kernels Permittivity Estimation***

347 The permittivity of coffee particle kernels was determined using equations (4-5), the  
 348 average density of the coffee particle kernels presented in (Nakilcioğlu-Taş and Ötleş  
 349 2019) e.g.,  $\rho_c = 0.91 \text{ g/cm}^3$ , and Figure 4 data of ground coffee permittivity versus bulk  
 350 density. Figure 6 shows that relatively similar permittivity values of coffee particle  
 351 kernels are determined while employing varied bulk densities. Modest discrepancies may  
 352 be explained by small mistakes in bulk density determination and the intrinsic inaccuracy  
 353 of permittivity measurements. An average value for the dielectric constant and loss factor  
 354 was obtained and plotted as a constant. In the instance of the dielectric constant of the  
 355 coffee particle kernel,  $\varepsilon'_c$ , an average value of 2.87 and a RMSE of 0.0234 were obtained.  
 356 The estimated average value and RMSE of the coffee particle kernel loss factor,  $\varepsilon''_c$ , were  
 357 0.31 and 0.0076, respectively.



**Fig. 6.** Estimation of average permittivity of coffee particle assuming  $\rho_c = 0.71 \text{ g/cm}^3$  and using equations (3-4).  $T = 24^\circ\text{C}$ ;  $X = 4.8 \%$ .

### Conclusions

In this contribution, the dielectric properties of roasted ground coffee have been measured under various temperature, bulk density, and MC conditions. In addition, the permittivity of coffee granules was estimated using well-known equations and data from the literature, as well as bulk-density dependent measurements.

The development of permittivity versus temperature for roasted ground coffee is quite different to that of free water. The permittivity rose with the rising temperature in the first scenario. In the second situation, however, the permittivity declined with increasing temperature. One possible explanation for this difference is the interactions of water with the surrounding structure: the little amount of available water in coffee granules is bound to its internal structure.

Permittivity dependence on bulk density and MC was predicted for roasted ground coffee particle kernels. In both situations, the dielectric constant and loss factor rose in value as the density and MC increased. Furthermore, the average coffee particle kernel permittivity was calculated using the CRI mixing equation and permittivity observations at various bulk densities. The obtained data clearly reveals that the coffee particle kernel permittivity is greater than the permittivity of the ground coffee mixture.

The data presented in this paper will be used to develop sensors for MC determination of roasted ground coffee. The data can also be useful for developing computer models and simulating dielectric heating for microwave processing of roasted ground coffee, as well as providing a theoretical basis for coffee dehydration under dielectric heating. Further investigation is envisaged to develop prediction models capable of accurately estimating the permittivity values throughout a wider range of temperature, bulk density, moisture content, and frequency.

Finally, based on the measurements, one can conclude that the coffee particles under consideration can be processed using microwave technology. However, because permittivity increases with temperature, thermal runaway can occur, particularly at low MC levels where internal water evaporation is almost non-existent.

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390 The conference report "Permittivity Measurements for Roasted and Ground Coffee  
391 Versus Temperature, Bulk Density, and Moisture Content" had a good reception when it  
392 was presented at the Fourth Global Congress on Microwave Energy Applications  
393 (4<sup>th</sup> GCMEA) so the authors were encouraged by the organizers of the congress to prepare  
394 this paper solely for being reviewed by the Journal of Microwave Power and  
395 Electromagnetic Energy (JMPEE). This paper contains information and details that were  
396 not provided in the conference material. The Fourth Global Congress on Microwave  
397 Energy Applications (GCMEA) organized by Sichuan University together with The  
398 China Association of Microwave Power Applications (CAMPA), was hosted in Chengdu,  
399 Sichuan, China on August 17-20, 2022.

## 400 Disclosure Statement

401 The authors report there are no competing interests to declare.

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484 Table 1. Coffee samples conditions for each permittivity measurement test.

485 Figure 1. Methodology and setup for measuring the complex permittivity dependency  
486 on temperature.

487 Figure 2. Particle size distribution of coffee particle kernels.

488 Figure 3. Coffee permittivity versus temperature and exponential data fitting.  
489  $\rho_m = 0.37 \text{ g/cm}^3$ ,  $MC = 4.8 \%$ .

490 Figure 4. Coffee permittivity versus bulk density and polynomial data fitting.  $T = 24^\circ\text{C}$ ;  
491  $MC = 4.8 \%$ .

492 Figure 5. Coffee permittivity behaviour versus MC and polynomial data fitting.  
493  $\rho_m = 0.36 \text{ g/cm}^3$ ;  $T = 24^\circ\text{C}$

494 Figure 6. Estimation of average permittivity of coffee particle assuming  $\rho_c = 0.71 \text{ g/cm}^3$   
495 and using equations (3-4).  $T = 24^\circ\text{C}$ ;  $MC = 4.8 \%$ .

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