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Title: Comparison between conventional and ultrasound-assisted techniques for extraction of anthocyanins from grape pomace. Experimental results and mathematical modeling

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Keywords: anthocyanins; grape pomace; conventional solvent extraction; ultrasound-assisted extraction; first-principles modeling; mass transport coefficients

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Abstract: Conventional and ultrasound assisted extraction of anthocyanins from grape pomace are here analyzed and compared. Mathematical modeling is used firstly to represent the extraction process and determine the associated mass transport parameters, and afterwards, to obtain useful predictions on how the system behaves under different operating conditions. The mathematical model here developed is based on first-principles, aided by , in order to more accurately describe the underlying phenomena that govern the extraction process behavior. Extraction of anthocyanins from grape pomace is performed using a hydro alcoholic solution as solvent, and experimental runs at different temperatures were carried out for both conventional and ultrasound-assisted techniques. A good agreement between experimental and computed extraction yields was achieved as the reported statistical parameters indicate. Obtained results highlight the performance differences between both processes, and pinpoint which variables impact the most in the extraction yield.

To: Editor of *Journal of Food Engineering*

Subject: Submission of manuscript "Comparison between conventional and ultrasound-assisted techniques for extraction of anthocyanins from grape pomace. Experimental results and mathematical modeling"

Dear Sir,

Please find annexed with this letter the revised version of the manuscript "Comparison between conventional and ultrasound-assisted techniques for extraction of anthocyanins from grape pomace. Experimental results and mathematical modeling" for evaluation and publication, if accepted, in *Journal of Food Engineering*.

The authors state that this paper has not been published previously, it is not under consideration for publication elsewhere, and if accepted it will not be published elsewhere in substantially the same form, in English or in any other language, without the written consent of the Publisher.

I look forward to hearing from you. Yours sincerely,

María Agustina Reinheimer

## \*Highlights (for review)

- >> Opportunities identification in the recovery of anthocyanins from grape pomace
- >> Comparison of conventional and ultrasound-assisted extraction techniques
- >> Process representation by mathematical modeling
- >> Application of first principles equations and semi-empirical correlations
- >> Prediction of the system performance under different operating conditions

1           **Comparison between conventional and ultrasound-assisted techniques for**  
2           **extraction of anthocyanins from grape pomace. Experimental results and**  
3           **mathematical modeling**

4

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15

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28 statistical parameters indicate. Obtained results highlight the performance differences  
29 between both processes, and pinpoint which variables impact the most in the extraction  
30 yield.

31

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33 ultrasound-assisted extraction; first-principles modeling; mass transport coefficients

34

## 35 Nomenclature

### *Symbols*

<i>AED</i>	acoustic energy density (W/l)
<i>C</i>	anthocyanins concentration (mg/ml)
<i>D</i>	mass diffusivity (m <sup>2</sup> /s)
<i>k</i>	global mass transfer coefficient (m/s)
<i>K</i>	distribution constant (-)
<i>MW</i>	molecular weight (kDa)
<i>M</i>	number of radial discretization points (-)
<i>m</i>	mass (kg)
<i>N</i>	number of temporal discretization points (-)
<i>R</i>	sample radius (m)
<i>r</i>	spherical radial coordinate (m)
<i>s</i>	specific surface for mass transfer (m <sup>2</sup> /m <sup>3</sup> )
<i>T</i>	temperature (°C)
<i>t</i>	time (s)
$\Delta t$	temporal grid width (s)
<i>v</i>	agitation velocity (m/s)
<i>V</i>	volume (m <sup>3</sup> )
<i>V<sub>m</sub></i>	molar volume (at the boiling point) (m <sup>3</sup> /kmol)
<i>Y</i>	extraction yield (%)

### *Dimensionless groups*

<i>Re</i>	Reynolds's number (-)
<i>Sh</i>	Sherwood's number (-)
<i>Sc</i>	Schmidt's number (-)

### *Greek symbols*

$\varepsilon$	volume fraction of solvent (-)
$\delta$	spatial grid width (m)
$\rho$	density (kg/m <sup>3</sup> )
$\mu$	viscosity (kg/ms <sup>2</sup> )
$\varphi$	solvent association parameter (-)

### *Subscripts*

<i>0</i>	at initial
<i>a</i>	anthocyanins
<i>i</i>	at interphase
$\beta$	solid particle
$\gamma$	solvent phase
<i>f</i>	at final time
<i>p</i>	particle

### *Acronyms*

<i>CSE</i>	Conventional Solvent Extraction
<i>UAE</i>	Ultrasound-Assisted Extraction

## 37 **1. Introduction**

38 Grape pomace consists of the skin, stems, and seeds that remain after grapes  
39 processing in the wine industry, where large amounts of bagasse are generated. This by-  
40 product is usually discarded as natural waste or utilized as animal feed or compost  
41 (Monrad et al., 2010).

42 Furthermore, the wine lees obtained from red wine are a good source of  
43 anthocyanins that belong to a specific group of phenolic compounds. Polyphenols are  
44 chemical compounds that are characterized by a significant antioxidant capacity (Spigno  
45 and De Faveri, 2007), and their numerous health-benefiting properties, including  
46 oxidative stress reduction, free radical scavenging properties, assisting in cancer and  
47 disease risk reduction and cholesterol regulation (Stevenson and Hurst, 2007).

48 The extraction of bioactive components from vegetable by-products is an  
49 interesting way to increase the value of this waste product (Balasundram et al., 2006).  
50 Phenolic compounds can be extracted from plant-based materials by various extraction  
51 technologies and solvents, depending on their distribution in the plant matrix and  
52 chemical properties.

53 The conventional solvent extraction (CSE), which has been proposed for  
54 decades, requires prolonged extraction times and relatively large quantities of solvent.  
55 Therefore, various novel extraction techniques have been employed for the extraction of  
56 bioactive compounds from foods, including ultrasound-assisted extraction (Tao et al.,  
57 2014a), microwave-assisted extraction (Valdés et al., 2015) and supercritical fluid  
58 extraction (Meneses et al., 2015). Ultrasound-assisted extraction (UAE) can improve the  
59 extraction of heat-sensitive bioactive components by lower processing temperatures  
60 (Tao et al., 2014a), and is a more effective technique than conventional extraction (Both  
61 et al., 2014; He et al., 2016). The mechanical effects of ultrasound provide a greater

62 solvent penetration into cellular materials thus improving mass transfer, while the  
63 disruption of biological cell walls facilitates the release of its contents (Tao et al.,  
64 2014a). UAE has two main advantages compared with conventional extraction, which  
65 are reduced processing time and solvent volume usage, as shorter operating times are  
66 obtained compared with conventional methods (Veličković et al., 2006). However, there  
67 is a lack of published models describing the physics mechanisms for the internal and  
68 external mass transfer coefficients. This point will be further explained and addressed in  
69 the model here proposed.

70 In food engineering, it is important to implement mathematical models of  
71 extraction processes to facilitate process design, optimization and control, as well as to  
72 provide useful information for equipment scale-up. These models usually consist of a  
73 set of algebraic, partial and ordinary differential equations (DAEs), implemented via  
74 suitable spatial discretization methods (e.g. finite differences, method of lines, finite  
75 elements, etc.), resulting in highly non-linear problems.

76 Rigorous and detailed modeling is a difficult task due to the complexity of the  
77 underlying mechanisms, uncertainties about the measurement of food properties, and  
78 difficulty for the achievement of reliable experimental data. In fact, the combination of  
79 first principles models with experimental data through empirical relationships is a  
80 common practice in order to accurately describe food processing by mathematical  
81 modeling (Banga et al., 2003). Such semi-empirical correlations usually comprise the  
82 main mass transfer coefficients (distribution constant and solute diffusion in the food  
83 matrix) for a given range of extraction conditions (temperature, type of solvent, solid  
84 and solvent ratio, agitation speed).

85 In particular, numerous studies have addressed the antioxidant extraction process  
86 from a food matrix (Cheng et al., 2016; Qu et al., 2010; Yim et al., 2012) and also the



87 specific extraction of other compounds from different food products (Da Porto et al.,  
88 2013; Espinoza-Perez et al., 2007; Reinheimer et al., 2014). Most of them describe the  
89 internal mass transfer, using kinetic modeling and fitting, to predict the internal mass  
90 diffusion coefficient. Meanwhile, some of them deal with the influence of critical  
91 variables on the extraction operation, such as pH, type and quantity of solvent, drying  
92 conditions, extraction temperature or maceration type (Reinheimer et al., 2014; Sun et  
93 al., 2011).

94         However, fewer works have addressed the extraction process using first-  
95 principles based models to precisely quantify the influence of the aforementioned  
96 variables in order to contribute to the process optimization. One important contribution  
97 in this field is the work of Garcia-Perez et al. (2010), where the authors proposed a  
98 mathematical model to calculate the initial antioxidant capacity of grape stalks, the  
99 effective diffusivity of antioxidants in the grape stalk structures and the mass transfer  
100 coefficient at the interface for different drying conditions. On the other hand, they did  
101 not address the distribution constant and diffusivity of antioxidant at the solvent phase,  
102 which are also important variables to describe the mass transfer mechanism. The model  
103 proposed by Espinoza-Perez et al. (2007) for caffeine extraction is a more  
104 comprehensive one, as it is based on mechanistic principles for the conventional  
105 extraction process, in which the mass transfer mechanism at the solvent phase and the  
106 distribution constant (determined in previous experiments) were incorporated.

107         On the other hand, models presented for ultrasound assisted extraction have been  
108 limited to describing the kinetics of the extraction by fitting experimental data to the  
109 analytical solution of the unsteady-state diffusion equation (D'Alessandro et al., 2014;  
110 Ruiz et al., 2011; Tao et al., 2014a).

111           The contribution here proposed addresses the description of the mechanism of  
112 the conventional solvent extraction and ultrasound-assisted extraction of anthocyanins  
113 from grape pomace, in order to evaluate and compare the different mass transfer rates.  
114 Differences for the mass transfer coefficients values (including diffusion, global mass  
115 transfer coefficients and distribution constants) are substantiated from a physical point  
116 of view. Therefore, a complete mathematical model to describe the mass transfer  
117 mechanism for CSE and UAE methods is here developed using first principles  
118 equations through DAEs and semi-empirical correlations, and validated by means of  
119 experimental runs. Temperature effect on the anthocyanins transfer kinetics and  
120 extraction yield are also studied.

121

## 122 **2. Materials and methods**

### 123 *2.1. Raw material and chemicals*

124           Pomace of red grapes (*Vitis vinifera L.*), donated by “Cátedra de Enología II” at  
125 “Universidad Nacional de Cuyo”, was employed for the development of the extraction  
126 experimental runs. Whole pomace was used, whereas seeds and skins were not  
127 separated in order to better approximate industrial processing conditions.

128           An ethanol-water mixture was selected as the extraction mean, since it was  
129 reported as one of the best solvent for extraction of polyphenols from grape waste  
130 (Librán et al., 2013). Ethanol is the most used solvent in antioxidants extraction, and it  
131 is the natural solvent of these compounds in the wine-making process. Other studies  
132 have shown that a 50% ethanol solution was the optimal mixture for polyphenols  
133 extraction. (Cacace and Mazza, 2003; Do et al., 2014)

134

135

136 *2.2. Preparation of grape marc flour*

137           The by-product was prepared according to the conditions reported by Sant'Anna  
138 et al. (2012) and Tao et al. (2014a), as they were proven to provide good yields at  
139 similar extraction conditions than the ones used in this work. Then, the grape marc  
140 samples were dried to about 7.5% moisture content in a dry oven (forced convection  
141 laboratory drying equipment) at 60 °C, and afterwards, they were grounded in a  
142 domestic mill. The powdered samples were sieved to separate particles passing an  
143 ASTM 40 sieve and retained by an ASTM 270 using a Ro-Tap sieve shaker (Tyler, US).  
144 Then, a statistical particle diameter, computed according to Vian and Ocón (1952), of  
145 0.26 mm was used for the extraction model. The ground samples were sealed and  
146 stored at 4 °C in darkness until use.

147

148 *2.3. Determination of initial anthocyanin concentration*

149           The initial content of anthocyanins was determined using the method described  
150 by Tao et al. (2014b) with slight modifications. According to preliminary studies, 50%  
151 aqueous ethanol was selected as the extraction solvent, as it was observed a high  
152 extraction capacity. An amount of 10 g of grape pomace and 400 mL of 50% aqueous  
153 ethanol solution were mixed in a 600 mL beaker. Anthocyanins were extracted  
154 exhaustively at 45 °C under agitation for 48 h. After that, the liquid extract was  
155 separated from the solid by filtration. The residual grape pomace was moved back into  
156 the beaker and another 100 mL fresh 50% aqueous ethanol was added. The suspension  
157 was treated at 45 °C with agitation for 4 h, followed by filtration. The two filtrates were  
158 mixed. The total anthocyanins content in this filtrate was determined using the method  
159 explained in Section 2.5 and it was regarded as the initial content of total anthocyanins  
160 in the grape pomace, which was determined to be 10.71 mg/g.

161

#### 162 2.4. Extraction experiments

163 The extraction experiments were performed with a batch extractor of 0.6 L and a  
164 paddle agitator. The extractor was placed in a thermostatic and ultrasonic bath system  
165 (TB04, Testlab, Argentina). The ultrasonic system was turned on for UAE, while it was  
166 turned off for CSE.

167 In the case of ultrasonic assistance, the sonication was applied in continuous  
168 mode at a frequency of 40 kHz and an electric power output of 160 W. Then, the  
169 calculated power density of ultrasound dissipated into the medium with an extraction  
170 volume of 400 ml was 0.4 W/ml. The ultrasonic energy required for 30 minutes of  
171 sonication was 720 J/ml. An acoustic energy density (*AED*) of 36.2 W/l was computed  
172 according to Tao et al., (2014a), as the ratio between the consumed power and the total  
173 volume of solution used in the experiment.

174 The calculated power density could be considered in the region of low  
175 sonication or low intensity treatment, as reported many authors (J. Mason et al., 2011;  
176 Karki, 2009; Zhou et al., 2013). This value could be advantageous for energy efficiency  
177 studies considering the potentiality of scaling up. Frequency, batch volume and power  
178 output could be combined to achieve the desired outcome on a larger scale maintaining  
179 a target of low power dissipation. However, a carefully revision of costs should be  
180 considered (Karki, 2009). Some efforts of viable scaling up ultrasonic aided extraction  
181 have been reported in the literature (Paniwnyk et al., 2009; Vilku et al., 2008; Viro et  
182 al., 2010; Wang et al., 2015).

183 The temperature in the flask was controlled with a thermometer. The flask  
184 containing the mixture was immersed in the bath and fixed in position. The water inside  
185 the bath flowed through a circulator system.

186 In all experiments, for both extraction types, the agitation speed was set at 460  
187 rpm, which gives an agitation velocity of 1.083 m/s when considering an agitator blades  
188 diameter of 0.045 m. The initial solid to solvent ratio was fixed to 1:40 (10 g grape  
189 marc/sample in 400 mL solvent). Temperature was set at 25, 45 and 65 °C. As solvent,  
190 a 50 % vol. ethanol–water mixture was used. In all studied conditions, at specific time  
191 intervals (5, 10, 15, 20, 25 and 30 min), 5 ml of the solution were taken for analysis. At  
192 the end of each extraction process, the crude extracts were filtered through a Whatman  
193 40 filter. Afterwards, the samples were stored in amber bottles at -4 °C until the  
194 antioxidant activity was measured by spectrophotometry.

195 After each sample extraction, the extracted volume was not replaced with fresh  
196 solvent. Thus, 7.5% of the overall volume is removed in subsequent sampling; since this  
197 amount is less than 10% compared to the overall volume, the extraction volume was  
198 considered as constant.

199

## 200 2.5. Determination of total anthocyanins

201 Determination of total anthocyanins in each extracted sample was performed  
202 using the method proposed by Di Stefano et al. (1989) and described by Ivanova et al.  
203 (2011) by duplicate. Samples were diluted with a solution consisting of  
204 ethanol/water/HCl (69/30/1 v/v/v) and the absorbance was measured at 540 nm, in a  
205 Jasco Spectrophotometer (7800 UV/Vis). The total anthocyanins content was calculated  
206 by means of Eq. (1), as proposed by Di Stefano et al. (1989).

$$207 C_{a,\gamma} = 16.7 A_{540nm} d \quad (1)$$

208 where  $d$  is the dilution factor,  $A_{540nm}$  is the absorbance at 540 nm,  $C_{a,\gamma}$  is the content  
209 expressed in mg/L as malvidin-3-glucoside equivalents.

210

### 211 **3. Mathematical model**

212 Several possible mass transfer mechanisms have been proposed in order to model  
213 the extraction process (Aguilera and Stanley, 1999; Bäumler et al., 2011; Cissé et al.,  
214 2012; Espinoza-Perez et al., 2007; Garcia-Perez et al., 2010). In this context, the  
215 following phenomenological steps are here taken into account:

- 216 • Entrance of the solvent into the solid matrix.
- 217 • Solvent penetration and diffusion inside the solid matrix.
- 218 • Solubilization of the soluble compound.
- 219 • Solute transport to the surface of the solid matrix by diffusion.
- 220 • Migration of the extracted solute from the external surface into the bulk solution.

221

#### 222 *3.1. Assumptions*

223 In order to describe the anthocyanin transfer and to study the extraction kinetics,  
224 the following hypotheses are used to derive the mathematical model:

- 225 • The solid particles are spherical.
- 226 • The anthocyanins diffuse to the surface of each sphere according to Fick's second  
227 law.
- 228 • The anthocyanins in the extracted sample are within the structure of intact cells and as  
229 part of disrupted superficial cells. The latter can be produced by physical manipulation  
230 and exacerbated by ultrasound.
- 231 • The anthocyanins rate of extraction from disrupted cells is comparatively faster than  
232 within intact cells. The extraction rate at the first period is assumed to occur by a  
233 washing phenomenon.
- 234 • Free and bound anthocyanins extraction takes place simultaneously.

- 235 • Size, shape and density of the particles do not change during the extraction process.
- 236 Solid particles are characterized by a given diameter and an initial uniform anthocyanin
- 237 concentration.
- 238 • Temporal variation of the anthocyanins concentration is considered in the radial
- 239 direction within each particle (1-D model).
- 240 • Perfect mixing between solvent and particles.
- 241 • Only anthocyanins diffuse from within the solid to the surface. The diffusion
- 242 coefficient is independent of time.
- 243 • Anthocyanins are transferred by convection from the solid surface to the solvent.
- 244 • The agitation speed for the ultrasound assisted process is considered approximately
- 245 10% higher than for the conventional process to account for the generated shockwaves
- 246 and high speed jets, and thus the increased mass transfer rate.
- 247 • The anthocyanins concentration is homogeneous at the solvent phase (perfect mixing).
- 248 Solute concentration in the solvent phase is only function of time.
- 249 • The anthocyanins concentration at the solid interface is at equilibrium with the
- 250 anthocyanins concentration at the bulk solvent.
- 251 • The volume of the solvent phase is kept constant.
- 252 • There are neither chemical reactions nor ultrasonic degradation of anthocyanins
- 253 during the whole extraction process.

254

### 255 3.2. Equations

256 Based on the aforementioned assumptions, the internal mass transfer is described

257 by Fick's second law in 1-D and spherical coordinates, applied for the disperse phase of

258 grape pomace flour according to Eq. (2).

$$259 \frac{(1-\varepsilon)}{D_{a,\beta}} \frac{\partial C_{a,\beta}(r,t)}{\partial t} = (1 - \varepsilon) \frac{\partial^2 C_{a,\beta}(r,t)}{\partial r^2} + \frac{2(1-\varepsilon)}{r} \frac{\partial C_{a,\beta}(r,t)}{\partial r}, \quad 0 < r < R \quad (2)$$

260 where  $C_{a,\beta}$  is the anthocyanins concentration inside the particle, and  $D_{a,\beta}$  is the  
 261 diffusivity coefficient of anthocyanins within each particle.

262 Here,  $\varepsilon$  is the solvent volume fraction defined by Eq. (3), where  $V_\gamma$  and  $V_\beta$  are  
 263 the volume of the solvent phase and volume of the solid particle, respectively.

$$264 \quad \varepsilon = \frac{V_\gamma}{V_\gamma + V_\beta} \quad (3)$$

265 The initial and boundary conditions are introduced by Eqs. (4-6). Here, Eq. (4)  
 266 assumes homogeneous initial anthocyanins concentration in the particles; Eq. (5)  
 267 corresponds to the boundary condition at the center of each sphere where there is no  
 268 mass transfer; Eq. (6) represents the interfacial anthocyanins flux, where  $k_{a,\gamma}$  is the  
 269 global mass transfer coefficient in the solvent phase,  $C_{a,\gamma}$  is the concentration in the  
 270 bulk solvent and  $C_{a,\gamma,i}$  is the concentration of anthocyanins at the solid-solvent  
 271 interphase.

$$272 \quad C_{a,\beta}(r, t) = C_{a0,\beta}, 0 \leq r \leq R, t = 0 \quad (4)$$

$$273 \quad \frac{\partial C_{a,\beta}(r, t)}{\partial r} = 0, r = 0, t > 0 \quad (5)$$

$$274 \quad -D_{a,\gamma} \frac{\partial C_{a,\beta}(r, t)}{\partial r} = k_{a,\gamma} (C_{a,\gamma,i}(t) - C_{a,\gamma}(t)), r = R, t > 0 \quad (6)$$

275 A typical simplification, extensively used in chemical engineering mass transfer  
 276 operations including solid–liquid extraction (Geankoplis, 1993), is the representation of  
 277 the mass transfer in both phases with macroscopic models. The macroscopic mass  
 278 transfer into the solvent phase is described by Eq. (7), while Eq. (8) represents the  
 279 macroscopic mass transfer in the particles, and Eq. (9) gives the non-accumulation in  
 280 the interface.

$$281 \quad \varepsilon \frac{dC_{a,\gamma}(t)}{dt} = k_{a,\gamma} s (C_{a,\gamma,i}(t) - C_{a,\gamma}(t)), 0 < t < t_f \quad (7)$$

$$282 \quad (1 - \varepsilon) \frac{d\langle C_{a,\beta} \rangle(t)}{dt} = k_{a,\beta} s (C_{a,\beta,i}(t) - \langle C_{a,\beta} \rangle(t)), 0 < t < t_f \quad (8)$$



283  $k_{a,\gamma} (C_{a,\gamma i}(t) - C_{a,\gamma}(t)) = -k_{a,\beta} (C_{a,\beta i}(t) - \langle C_{a,\beta} \rangle(t)), 0 < t < t_f$  (9)

284 Afterwards, Eqs. (7-9) can be reduced to Eq. (10), thus obtaining a system which  
 285 is consistent with respect to the mass balances.

286  $(1 - \varepsilon) \frac{d\langle C_{a,\beta} \rangle(t)}{dt} = -\varepsilon \frac{dC_{a,\gamma}(t)}{dt}, 0 < t < t_f$  (10)

287 Here,  $s$  is the specific surface for mass transfer for spherical particles, as defined  
 288 by Eq. (11).

289  $s = \frac{6}{2R}$  (11)

290 The equilibrium at the interface of the anthocyanins concentration under the  
 291 assumption of diluted solution, is expressed by means of Eq. (12), where  $K$  is the  
 292 distribution constant.

293  $C_{a,\gamma i}(t) = K C_{a,\beta i}(t), r = R, t > 0$  (12)

294 Extraction yield ( $Y$ ) is a measure of the solvent efficiency to extract specific  
 295 components from the original material, according to Eq. (13), and is calculated as the  
 296 ratio of the amount of anthocyanins extracted and the initial amount of anthocyanins  
 297 present in the grape pomace flour.

298  $Y(t) = \frac{m_{a,\gamma}(t)}{m_{a0,\beta}} 100 = \frac{C_{a,\gamma}(t) V_\gamma}{C_{a0,\beta} V_\beta} 100, t > 0$  (13)

299 The estimation of the average anthocyanins concentration at each instant of time  
 300 in the solid spheres is obtained by integrating local concentrations over volume.  
 301 Specifically, the average anthocyanins concentration in the phase  $\beta$  is expressed as  
 302 stated in Eq. (14), which can be solved by means of Simpson's rule.

303  $\langle C_{a,\beta} \rangle(t) = \frac{\int_0^V C_{a,\beta}(r,t) dV}{\int_0^V dV}, t \geq 0$  (14)

304 The anthocyanins mass balance into the solid particle and the solvent is given as:  
 305 [Initial mass of anthocyanins in grape pomace flour] = [Mass of anthocyanins in

306 disperse solid phase] + [Mass of anthocyanins in solvent phase]. Therefore, Eqs. (15-16)  
307 represent the mass balances at the initial time and at equilibrium.

$$308 \quad C_{a0,\beta} V_{\beta} = \langle C_{a,\beta} \rangle_{t=t_0} V_{\beta} \quad (15)$$

$$309 \quad C_{a0,\beta} V_{\beta} = \langle C_{a,\beta} \rangle_{t=t_f} V_{\beta} + C_{a,\gamma} V_{\gamma} \quad (16)$$

310

### 311 *3.4. Parameters*

312 The main model parameters can be classified into the following categories:

- 313 • Operating conditions used for extraction experiences: temperature and extraction time,  
314 solvent volume fraction, agitation velocity, particle diameter, and acoustic energy  
315 density for UAE method.
- 316 • Physical properties: density, viscosity and molecular weight of solvent, molar volume  
317 of solute at its boiling point.
- 318 • Mass transfer coefficients: internal and external mass transfer coefficients.

319 Table 1 lists the main model input data related to experimental results and  
320 physicochemical properties obtained by means of commercial software or from the  
321 literature.

322 Also note that it is also hereafter proposed to implement, where available and  
323 valid, correlations reported in the literature to predict the mass transfer coefficients. This  
324 strategy also facilitates the resolution of the non-linear mathematical model, as the  
325 degrees of freedom are reduced (if the degrees of freedom are high, the optimal solution  
326 could be inconsistent from the physics point of view).

327

#### 328 *3.4.1. Anthocyanin diffusivity coefficient within the particles*

329 Tao et al. (2014a) developed an empirical correlation based on the Fick's second  
330 law to estimate the effective diffusion coefficient  $D_{a,\beta}$  of phenolic compounds from

331 grape marc considering the effects of the acoustic energy density (*AED*) and the  
 332 extraction temperature, using ethanol solution of 50%. The correlations developed for  
 333 total phenolic compounds are applied to calculate the anthocyanin diffusivity coefficient  
 334 for the ultrasound assisted extraction. Two correlations are proposed by Tao et al.  
 335 (2014a) considering that the mechanism of the extraction process is formed by two  
 336 stages: a first step of washing (dissolution of anthocyanins near the particle surface), in  
 337 which a rapid increase of extraction yield is evidenced, according to Eq. (17); and a  
 338 second stage in which the extraction process is slower (diffusion from the solid particles  
 339 to the liquid extract), according to Eq. (18). In addition, Tao et al. (2014a) found  
 340 experimentally that the transition from the washing stage to the slow extraction stage  
 341 takes place for a fraction of total phenolics released in the range of 85-93%.

$$342 \quad D_{a,\beta-fast} = 8.913 \times 10^{-30} (AED)^{0.6927} (T + 273.15)^{7.087} \quad (17)$$

$$343 \quad D_{a,\beta-slow} = 5.525 \times 10^{-19} (AED)^{0.1459} (T + 273.15)^{2.701} \quad (18)$$

344 No works reporting correlations for the estimation of the diffusion coefficient  
 345 within the particles for the CSE method have been found. Note that in the model, the  
 346 mechanism of the conventional extraction process is also considered as occurring in two  
 347 stages (washing and slow extraction). Then, these coefficients are kept as optimization  
 348 variables in the mathematical model.

349

### 350 *3.4.2. Anthocyanin diffusivity coefficient at the solvent phase*

351 For conventional solvent extraction, the Wilke and Chang (1955) correlation was  
 352 used to estimate the anthocyanins diffusion coefficient at the solvent phase  $D_{a,\gamma}$ , which  
 353 is recommended for biological solutes, as given by Eq. (19).

$$354 \quad D_{a,\gamma} = 1.173E10^{-16} (\varphi MW_{\gamma})^{0.5} \frac{T+273.15}{\mu_{\gamma} V_{m,a}^{0.6}} \quad (19)$$

355 No works reporting correlations for the estimation of the diffusion coefficient at  
356 the solvent phase for the UAE method have been found. Then, these coefficients are  
357 kept as optimization variables in the mathematical model.

358

### 359 3.4.3. Global mass transfer coefficient

360 The global mass transfer coefficient  $k_{a,\gamma}$  was calculated using the correlation  
361 proposed by Geankoplis (1993) for fixed beds and also valid for fluidized beds of  
362 spheres in the Reynolds number range of (2–2,000), according to Eq. (20), in  
363 conjunction with Eqs. (21-23).

$$364 \quad Sh = 2 + 0.95 (Re)^{0.5} (Sc)^{1/3} \quad (20)$$

$$365 \quad k_{a,\gamma} = \frac{Sh D_{a,\gamma}}{2 R} \quad (21)$$

$$366 \quad Sc = \frac{\mu_\gamma}{D_{a,\gamma} \rho_\gamma} \quad (22)$$

$$367 \quad Re = \frac{2 R \rho_\gamma v}{\mu_\gamma} \quad (23)$$

368

### 369 3.5. Resolution strategy

370 Eqs. (2, 5-7) were discretized using the central finite difference method (CFDM)  
371 and the implicit method. This scheme, which has first-order accuracy in time and  
372 second-order accuracy in space, is unconditionally stable and convergent. Eqs. (24-25)  
373 define the radial and temporal variations, respectively, with  $M = 6$  and  $N = 6$ .

$$374 \quad \delta = \frac{R}{M} \quad (24)$$

$$375 \quad \Delta t = \frac{t_f}{N} \quad (25)$$

376 Eq. (26) computes the approximation of Eq. (2) for internal nodes.

$$\begin{aligned}
377 \quad & \frac{(1-\varepsilon)(C_{a,\beta}(r,t+1)-C_{a,\beta}(r,t))}{D_{a,\gamma} \Delta t} = (1-\varepsilon) \left( \frac{C_{a,\beta}(r-1,t+1)-2C_{a,\beta}(r,t+1)+C_{a,\beta}(r+1,t+1)}{\delta^2} + \right. \\
378 \quad & \left. \frac{C_{a,\beta}(r+1,t+1)-C_{a,\beta}(r-1,t+1)}{2\delta} \right), 0 < r < R; 0 < t < t_f \quad (26)
\end{aligned}$$

379 Eqs. (27-28) are the constraints related to the discretization of Eqs. (5-6), which  
380 are the boundary conditions at the center and surface of each solid particle, respectively.

$$381 \quad \frac{-3C_{a,\beta}(r,t)+4C_{a,\beta}(r+1,t)-C_{a,\beta}(r+2,t)}{2\delta} = 0, r = 0, t > 0 \quad (27)$$

$$382 \quad -D_{a,\gamma} \frac{C_{a,\beta}(r-2,t)-4C_{a,\beta}(r-1,t)+3C_{a,\beta}(r,t)}{2\delta} = k_{a,\gamma} (C_{a,\gamma,i}(t) - C_{a,\gamma}(t)), r = R, t > 0 \quad (28)$$

383 Eq. (29) computes the approximation of Eq. (10).

$$384 \quad (1-\varepsilon) \frac{(C_{a,\beta})(t+1)-(C_{a,\beta})(t)}{\Delta t} = -\varepsilon \frac{C_{a,\gamma}(t+1)-C_{a,\gamma}(t)}{\Delta t}, 0 < t < t_f \quad (29)$$

385 Therefore, the proposed mathematical model for conventional and ultrasound-  
386 assisted techniques for extraction of anthocyanins from grape pomace is summarized in  
387 Figure 1. Here, equations which are used for representing only one or both techniques,  
388 CSE and UAE, can be easily identified.

389 In order to obtain the optimal values of the practical interest variables, the root-  
390 mean-square error (RMSE) is minimized, as it represents the sum of the differences  
391 between the experimental data points and the corresponding values predicted by the  
392 model. The proposed non-linear programming model was implemented in GAMS  
393 (General Algebraic Modeling System) and solved using CONOPT (Drud, 1996), an  
394 algorithm based on the reduced gradient method. The resulting model involves 452  
395 variables and 430 constraints.

396

397

398

399

400

## 401 **4. Results and discussion**

### 402 *4.1. Kinetics of extraction*

403 Figure 2 plots the experimental data points and the predicted evolution of the  
404 anthocyanins concentration at the solvent phase ( $C_{a,\gamma}$ ) during the CSE and UAE  
405 experiences. It is observed that, for both methods and all temperatures, anthocyanin  
406 concentration increased asymptotically tending to an equilibrium concentration.

407 As observed in Figure 2, the kinetic behavior between CSE and UAE exhibits  
408 different trends for the washing stage, where the anthocyanins concentration in the  
409 solvent phase grows quickly. The washing stage for UAE is faster than for CSE at the  
410 same temperature and solvent ratio.

411 The equilibrium concentration for UAE is obtained between 300 and 600  
412 seconds before than for CSE. The enhancement in the extraction rate for UAE obtained  
413 by the disruption of cell walls are in accordance with the results reported by  
414 Balachandran et al. (2006); Hemwimol et al. (2006); Ruiz et al. (2011); Veličković et al.  
415 (2006) and Zhao et al. (2007).

416 As can be seen in Figure 2, the extraction kinetic curves are improved by the  
417 extraction temperature over the examined range. At extraction temperatures of 25, 45,  
418 and 65 °C, the maximum anthocyanins concentration obtained for CSE at 1800 seconds  
419 are 0.373, 0.453 and 0.475 mg/mL, respectively. Meanwhile, the maximum  
420 anthocyanins concentration obtained for UAE at 1800 seconds are 0.386, 0.475 and  
421 0.479 mg/mL at the same temperatures. When compared, about 80% anthocyanins were  
422 extracted in the first 600 seconds for CSE, while 90% of anthocyanins were recovered  
423 for UAE in the same time. These values were close to the ones reported by Garcia-Perez  
424 et al. (2010) for the antioxidant extraction from grape pomace using ethanol as solvent.

425 Equilibrium concentration is reached in the early minutes of the extraction. After  
426 1800 seconds, the extraction yield increased only by 1–5% and 0.7-1% for CSE and  
427 UAE, respectively. According to the obtained experimental results, it is also observed  
428 that the extraction yield of anthocyanins increases as temperature does.

429 In order to evaluate the effect of ultrasound on the extraction kinetics, Eq. (30) is  
430 used, where  $Y|_{UAE}$  is the extraction yield with ultrasonic assistance and  $Y|_{CSE}$  is the  
431 extraction yield without irradiation.

$$432 \text{ Effect of UAE}(t) = \frac{(Y(t)|_{UAE} - Y(t)|_{CSE})}{Y(t)|_{CSE}} 100 \quad (30)$$

433 Figure 3 compares the time evolution of the ultrasound effect on total  
434 anthocyanins extraction yield at the three experimental temperatures. It can be observed  
435 that the ultrasonic effect enhances the mass transfer rate at the beginning of the  
436 extraction process, i.e. the washing stage. In fact, ultrasound waves and the cavitation  
437 effect they produce can alter biological materials and their physical and chemical  
438 properties, facilitating the release of extractable compounds and enhancing mass  
439 transport by disrupting cell walls (Chemat et al., 2011). It can be assumed that the  
440 cavitation process incited by ultrasound provokes cells swelling, solvent uptake, pores  
441 enlargement, and therefore a diffusivity increment across the cell walls. A possible  
442 disruption of plant cell walls or small positive effect on extraction due to local  
443 ultrasound heating of the vegetal source could also be noticed (D'Alessandro et al.,  
444 2014).

445 It was observed that the effect of ultrasound was always higher in the beginning  
446 of the extraction processes and it decreased considerably with the extraction time, while  
447 it had a less noticeable effect in the obtained equilibrium values for the total  
448 anthocyanins concentration in the solvent.

449

450 *4.2. Analysis of the mass transfer properties*

451 Table 2 summarizes the values of the mass transfer coefficients and the  
452 goodness of fit of the model to the obtained experimental data.

453 First of all, it can be observed in Table 2 that the accuracy of the model to  
454 predict the anthocyanin concentration evolution at the solvent phase is satisfactory for  
455 both extraction processes, CSE and UAE, according to the reported statistical  
456 parameters. The goodness of fit may be observed in the values close to 1 of the  
457 determination coefficient ( $R^2$ ) and small root mean square error (RMSE) values, thus  
458 indicating a good agreement between experimental and predicted values.

459 In most cases in the food processing industry (Cissé et al., 2012; Tao et al.,  
460 2014a), the solubility and diffusion coefficient of the material which is being extracted  
461 will increase with temperature, resulting in a higher rate of extraction. Nevertheless, the  
462 processing temperature cannot be increased indefinitely, because bioactive compounds  
463 are relatively thermo-labile, being susceptible to degradation at high temperatures  
464 (Pingret et al., 2013).

465 Accordingly, it was here found that the effective diffusion coefficient of  
466 anthocyanins  $D_{\alpha,\beta}$  at both CSE and UAE experiences increased with temperature, which  
467 may be caused by an increment of the internal energy of the molecules and thus their  
468 mobility, and a reduction of the dynamic viscosity coefficient.

469 In the model here presented, the diffusion process is considered as a fast  
470 diffusion stage (washing process) followed by a slow transfer rate (slow extraction).  
471 Following the proposal by Tao et al. (2014a), the transition was here determined to  
472 occur at an anthocyanin extracted fraction of around 84% for CSE and around 90% for  
473 UAE. It is also observed that the diffusivity coefficients for CSE (computed by the



474 model) are lower than for UAE (estimated through empirical correlations) in both  
475 stages, although the difference is larger at the washing stage.

476 The obtained values for the diffusion coefficients are similar to the ones reported  
477 in the literature for grape by-products. For CSE, the value of the diffusivity coefficients  
478 reported in Table 2 are of the same order of magnitude of those obtained by Garcia-  
479 Perez et al. (2010) at an extraction temperature of 60°C and Bucić-Kojić et al. (2013) at  
480 extraction temperatures in the range of 25 to 80°C. For UAE, the internal diffusion  
481 coefficients obtained using the empirical correlation proposed by Tao et al. (2014a) are  
482 similar to those obtained in the studies of ultrasound-assisted extractions of antioxidants  
483 from pomegranate peels and oil from pomegranate seeds reported by Goula (2013) and  
484 Pan et al. (2011), respectively.

485 The values obtained for the diffusivity of the anthocyanins at the solvent phase  
486  $D_{a,\gamma}$ , the global mass transfer coefficient in the solvent phase  $k_{a,\gamma}$ , and the distribution  
487 constant  $K$ , all follow similar increasing trends as the temperature does.

488 The global mass transfer coefficient is function of the agitation speed, which  
489 remains constant for each extraction method; while due to the increment in the agitation  
490 speed and the solvent diffusivity value for the UAE experiences,  $k_{a,\gamma}$  is higher for the  
491 same temperature than for the CSE ones.

492

### 493 *4.3. Prediction and confidence bands*

494 Figure 4 presents the confidence band (CB) and prediction band (PB) for the  
495 anthocyanin concentration at the solvent phase against time for the CSE and UAE  
496 experiences, respectively, at an operating temperature of 45 °C. It is noted that similar  
497 trends were observed when working at 25 and 65 °C.

498           The PB is the region where 95% of the experimental data points are expected to  
499 be, whereas it is here observed that all obtained observations fall within. Likewise, the  
500 CB is the region where 95% of the regression lines are expected to be, and contain more  
501 than 50% of the experimental values for all the experiences here reported. Both obtained  
502 CB and PB are well adjusted to the experimental data points, therefore increasing the  
503 confidence on the values predicted for the model parameters.

504           Normal probability plots of residuals are also presented in Figure 5 for the CSE  
505 and UAE experimental runs at 45 °C, respectively. As the data points are equally  
506 distributed above and below the line, it is verified that they are normally distributed and  
507 no unwanted trends or correlations among the data points exist (skewness, presence of  
508 an undefined variable, outliers, among others).

509

#### 510 *4.4. Sensitivity analysis*

511           In this section, parameters from empirical correlations and variables obtained  
512 through the proposed model are varied between -30% and 30%, in order to analyze their  
513 impact in the extraction yield. Figure 6 presents spider diagrams for CSE and UAE at 65  
514 °C for the fast and slow extraction periods. It is noted that similar trends were observed  
515 when working at 25 and 45 °C.

516           As can be appreciated in all figures, the internal diffusivity coefficient exerts the  
517 larger impact over the extraction yield, as it is the controlling process for the  
518 conventional and ultrasound assisted extraction of bio compounds. Therefore, the rest of  
519 the mass transfer parameters (diffusivity coefficients at solvent phase as well as global  
520 mass transfer coefficients) have little effect on the extraction yield.

521           The results here obtained are in agreement with the literature (Bucić-Kojić et al.,  
522 2013; Tao et al., 2014a), where it is expected that the internal diffusion is the controlling

523 step of the process, in which higher extraction rates are obtained for higher diffusion  
524 coefficients.

525

#### 526 *4.5. Performance of the extraction*

527 The proposed mathematical model for the extraction of anthocyanins from grape  
528 pomace could also be used to achieve predictions for the system behavior when working  
529 at different operative temperatures (or eventually, other practical interest parameters).  
530 Figure 7 presents the expected performance of the system for 30, 35, 40, 50, 55 and 60  
531 °C, which are intermediate to the ones used in the experimental runs.

532 For the new temperature values, it should be noted that the diffusivity coefficient  
533 within particles for UAE and the diffusivity coefficient at solvent for CSE were  
534 computed from the empirical correlations reported in section 3.4; while the rest of the  
535 mass transport properties were linearly interpolated from the values reported in Table 2.

536 It is then reaffirmed that temperature has a positive effect on extraction  
537 efficiencies; although caution should be exercised since high temperatures promote the  
538 oxidative reaction of phenolic compounds, which result in higher degradation rates.

539 Figure 8 allows estimating the extraction time necessary to achieve a value of  
540 the extraction yield of 50, 75 and 90%, when operating at temperatures in the range of  
541 25-65 °C. For both techniques (CSE and UAE), it is observed that the same  
542 anthocyanins yield can be obtained at lower extraction times as the temperature is  
543 increased.

544 Moreover, the effect of temperature becomes more noticeable for larger values  
545 of the extraction yield; while a 90% recovery may only be achieved when working  
546 above 55 °C for CSE and above 50 °C for UAE. As expected, the required operating  
547 time for reaching a given extraction yield is drastically reduced by the use of ultrasound

548 assistance; while for a given operative temperature, a higher yield is achieved for a  
549 longer extraction time.

550         The increment of extraction yield with temperature under CSE may be explained  
551 in the accelerated softening and swelling of materials and the increased solubility and  
552 diffusivity of anthocyanins.

553         In the case of UAE, the variation of extraction yield with temperature may be  
554 attributed to the combination of the cavitation and thermal effects. At lower  
555 temperatures, vapor pressure is low and ultrasound produces few cavitation bubbles.  
556 However, bubbles explode with a relatively large force, which enhances cell tissue  
557 disruption during extraction. Rising extraction temperature can result in an increase of  
558 vapor pressure and decrease of surface tension, thus decreasing energies released during  
559 the collapse of cavitation bubbles. Bubbles may easily collapse at higher temperatures  
560 thus reducing the enhancement of the mass transfer intensity. At higher temperatures,  
561 ultrasonic cavitation can be altered and the phenolic compounds may be oxidized.

562

## 563 **5. Conclusions**

564         In this work, experimental runs for the conventional and ultrasound-assisted  
565 extraction of anthocyanins from grape pomace are reported and thoroughly analyzed.  
566 Then, a complete mathematical model to describe the mass transfer mechanism for both  
567 methods is developed using first principles equations through DAEs and semi-empirical  
568 correlations.

569         Several statistical parameters show that the proposed model satisfactorily  
570 predicts the anthocyanin concentration evolution at the solvent phase for both extraction  
571 processes, CSE and UAE, while computing several mass transport coefficients,

572 including the diffusivities within the particle and at the solvent phase, the global mass  
573 transfer coefficient in the solvent phase, and the distribution constant.

574 Afterwards, the expected performance of the extraction for different operative  
575 conditions is predicted, thus providing useful information for designing, optimizing and  
576 scaling up of the conventional and ultrasound-assisted recovery of anthocyanins in the  
577 food processing industry.

578 Further analysis considering other important process variables such as agitation  
579 speed and solute-solvent ratio will be developed in future works.

580

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585

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745



**Table 1.** Model input data

Shape variable or property		Value	Source
$R$ (m)		$1.300 \times 10^{-4}$	Experimental result
$C_{a0,\beta}$ (kg/m <sup>3</sup> )		10.71	Experimental result
$v _{CSE}$ (m/s)		1.083	Experimental result
$v _{UAE}$ (m/s)		1.200	Experimental result
$a$ (m <sup>2</sup> /m <sup>3</sup> )		$2.307 \times 10^4$	Experimental result
$\varepsilon$ (-)		0.957	Experimental result
$AED$ (W/m <sup>3</sup> )		$36.158 \times 10^3$	Experimental result
$MW_\gamma$ (kg/kmol)		32.034	HYSYS (Hysys, Operations Guide., 2005)
$\mu_\gamma$ (kg/ms <sup>2</sup> )	T=25°C	$1.011 \times 10^{-3}$	HYSYS (Hysys, Operations Guide., 2005)
	T=45°C	$0.715 \times 10^{-3}$	
	T=65°C	$0.527 \times 10^{-3}$	
$\rho_\gamma$ (kg/m <sup>3</sup> )	T=25°C	940.2	HYSYS (Hysys, Operations Guide., 2005)
	T=45°C	923.1	
	T=65°C	905.4	
$V_{m,a}$ (m <sup>3</sup> /kmol)		0.522	(Geankoplis, 1993)
$\varphi$ (-)		2.050	(Geankoplis, 1993)

**Table 2.** Practical interest parameters obtained through the proposed model.

Parameter	CSE			UAE		
	T=25°C	T=45°C	T=65°C	T=25°C	T=45°C	T=65°C
$D_{a,\beta-fast}$ (m <sup>2</sup> /s)	8.586x10 <sup>-12</sup>	9.226x10 <sup>-12</sup>	9.784x10 <sup>-12</sup>	3.678x10 <sup>-11</sup>	5.828x10 <sup>-11</sup>	8.978x10 <sup>-11</sup>
$D_{a,\beta-slow}$ (m <sup>2</sup> /s)	7.977x10 <sup>-12</sup>	9.225x10 <sup>-12</sup>	9.784x10 <sup>-12</sup>	4.499x10 <sup>-12</sup>	5.361x10 <sup>-12</sup>	6.321x10 <sup>-12</sup>
$D_{a,\gamma}$ (m <sup>2</sup> /s)	4.142x10 <sup>-10</sup>	6.250x10 <sup>-10</sup>	9.016x10 <sup>-10</sup>	4.120x10 <sup>-8</sup>	4.855x10 <sup>-8</sup>	5.601x10 <sup>-8</sup>
$k_{a,\gamma}$ (m/s)	3.398x10 <sup>-4</sup>	4.725x10 <sup>-4</sup>	6.332x10 <sup>-4</sup>	7.923x10 <sup>-3</sup>	9.335x10 <sup>-3</sup>	1.077x10 <sup>-2</sup>
$K$ (-)	0.151	0.257	0.618	0.183	0.325	1.000
RMSE (-)	0.005	0.007	0.009	0.010	0.009	0.011
$R^2$ (-)	0.998	0.997	0.996	0.995	0.996	0.996
SSR (-)	0.109	0.134	0.161	0.123	0.149	0.179
SSE (-)	1.992x10 <sup>-4</sup>	3.601x10 <sup>-4</sup>	6.173x10 <sup>-4</sup>	6.700x10 <sup>-4</sup>	5.574x10 <sup>-4</sup>	8.014x10 <sup>-4</sup>
SST (-)	0.110	0.134	0.162	0.123	0.149	0.180

**Figure 1.** Summary of the mathematical model for representing the CSE and UAE of anthocyanins from grape pomace

**Figure 2.** Experimental and predicted values of anthocyanins concentration at solvent phase for CSE and UAE

**Figure 3.** Ultrasound assistance impact on the extraction of anthocyanins

**Figure 4.** Confidence and prediction bands for the anthocyanin concentration at the solvent phase

**a.** CB and PB for CSE at 45 °C

**b.** CB and PB for UAE at 45 °C

**Figure 5.** Normal probability plots of residuals

**a.** Residuals for CSE at 45 °C

**b.** Residuals for UAE at 45 °C

**Figure 6.** Sensitivity analysis for the anthocyanin extraction yield

**a.** Washing period of CSE at 65 °C

**b.** Slow extraction period of CSE at 65 °C

**c.** Washing period of UAE at 65 °C

**d.** Slow extraction period of UAE at 65 °C

**Figure 7.** Prediction of anthocyanins concentration evolution

**a.** Concentration at solvent phase for intermediate temperatures at CSE

**b.** Concentration at solvent phase for intermediate temperatures at UAE

**Figure 8.** Extraction performance for different operating conditions

**a.** Time and temperature for obtaining 50, 75 and 90% extraction yield through CSE

**b.** Time and temperature for obtaining 50, 75 and 90% extraction yield through UAE

Figure

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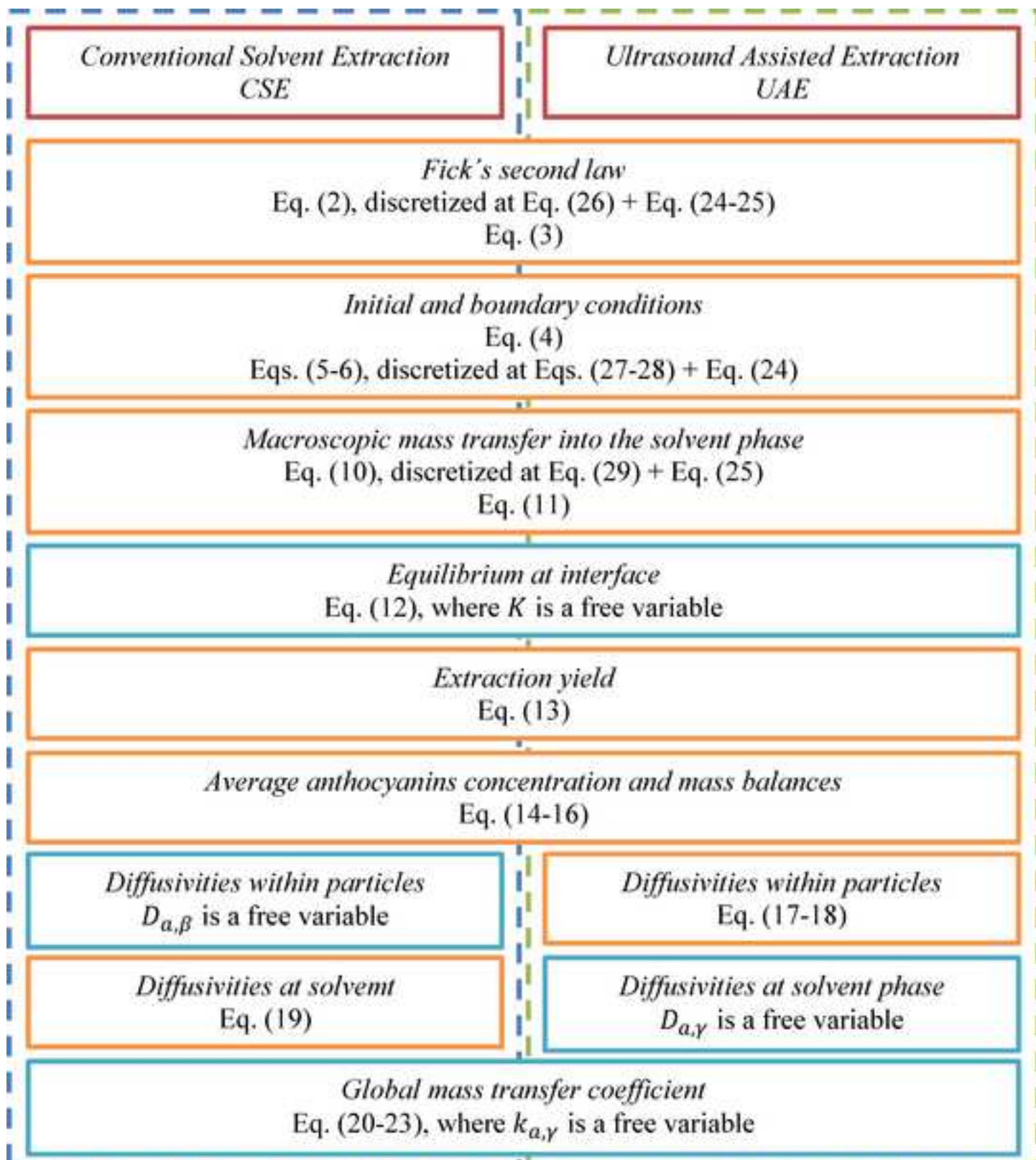


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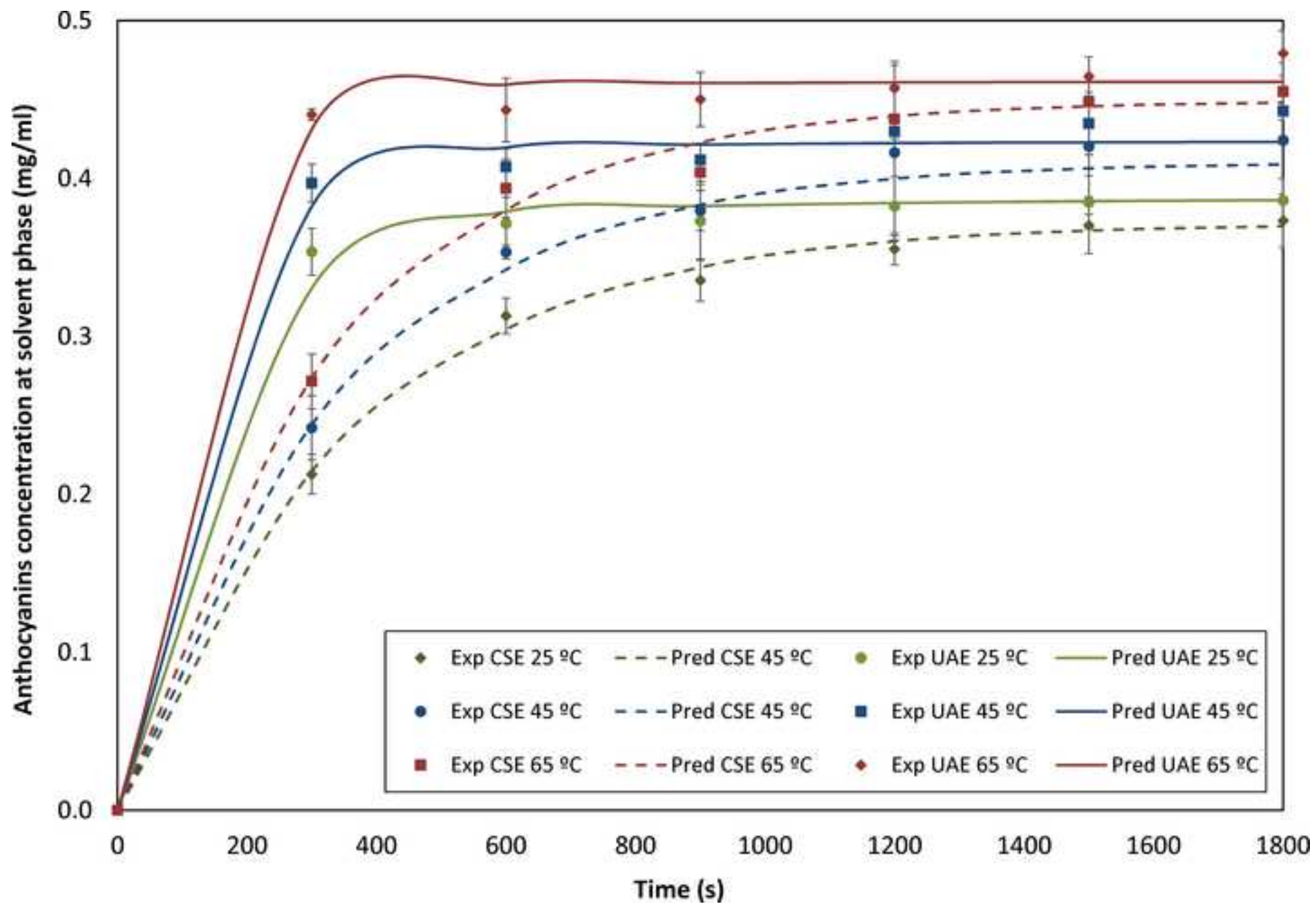


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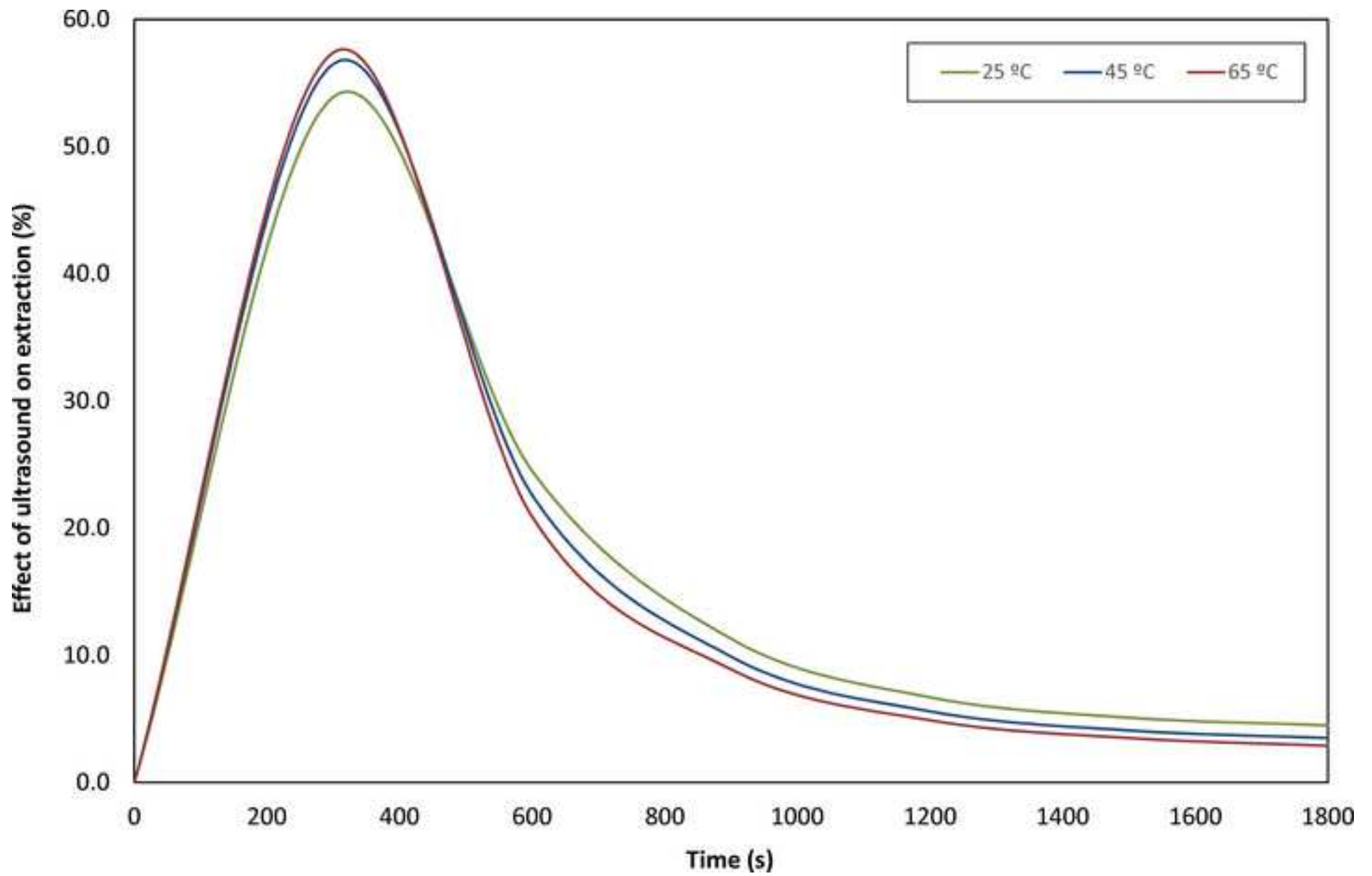


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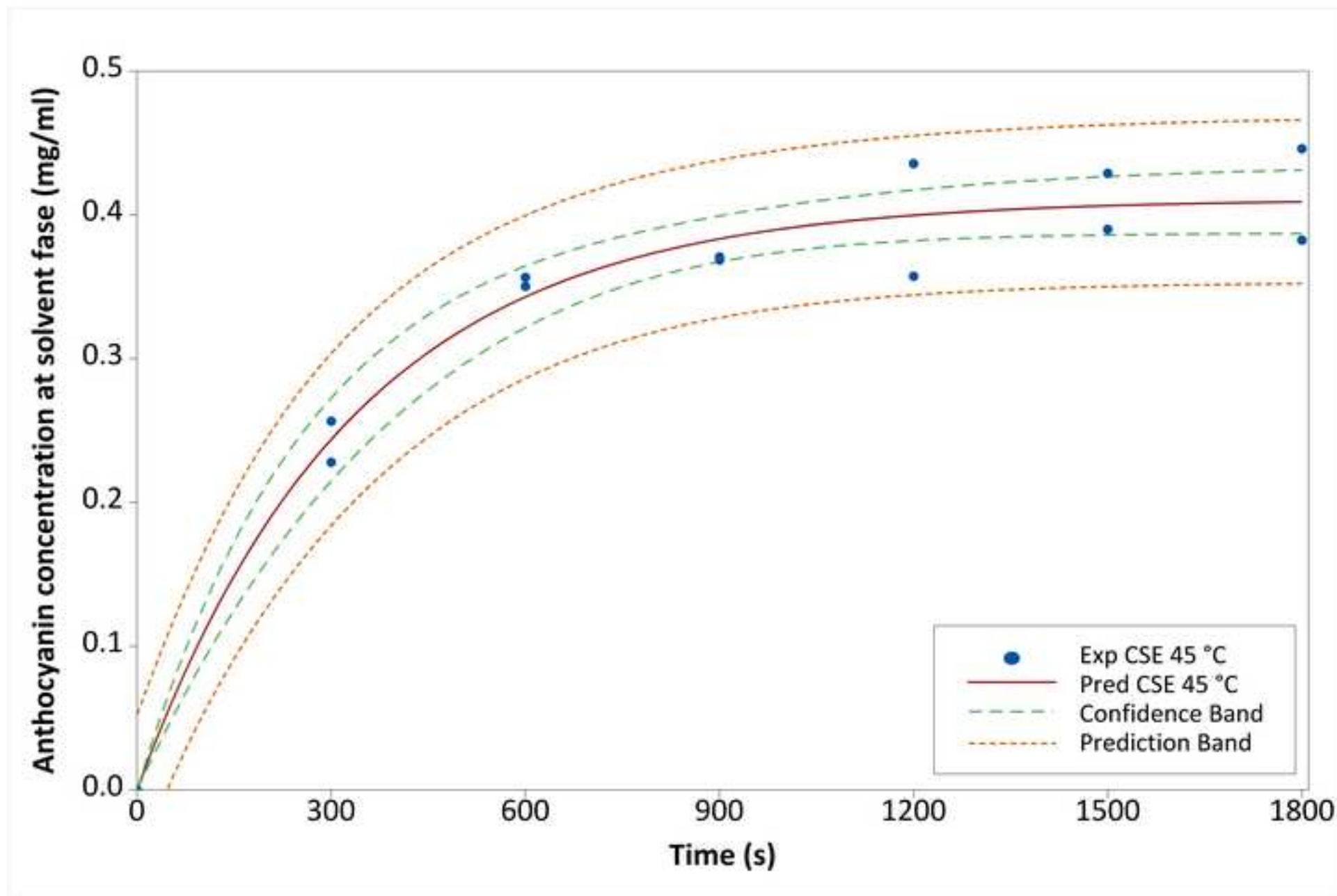


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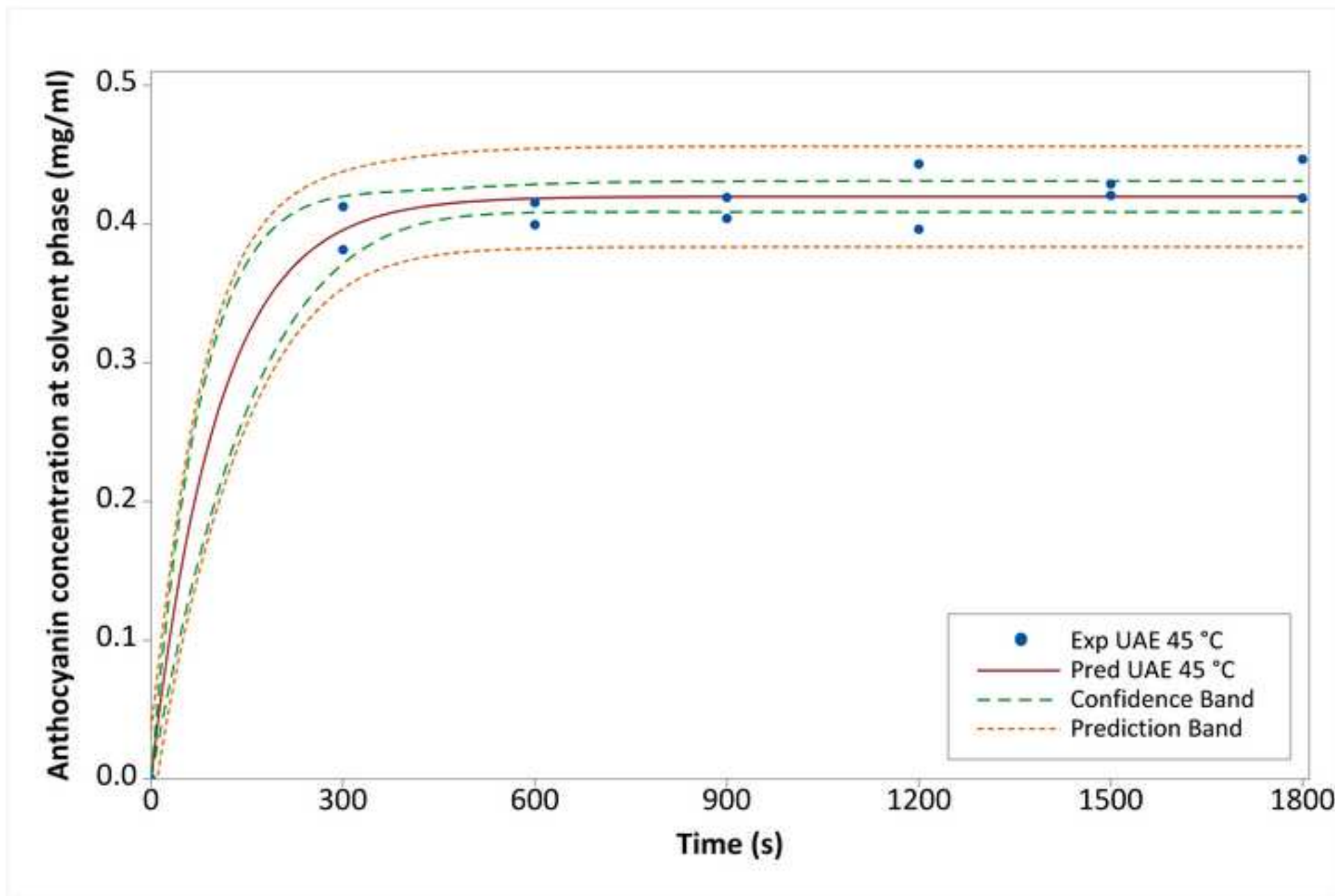




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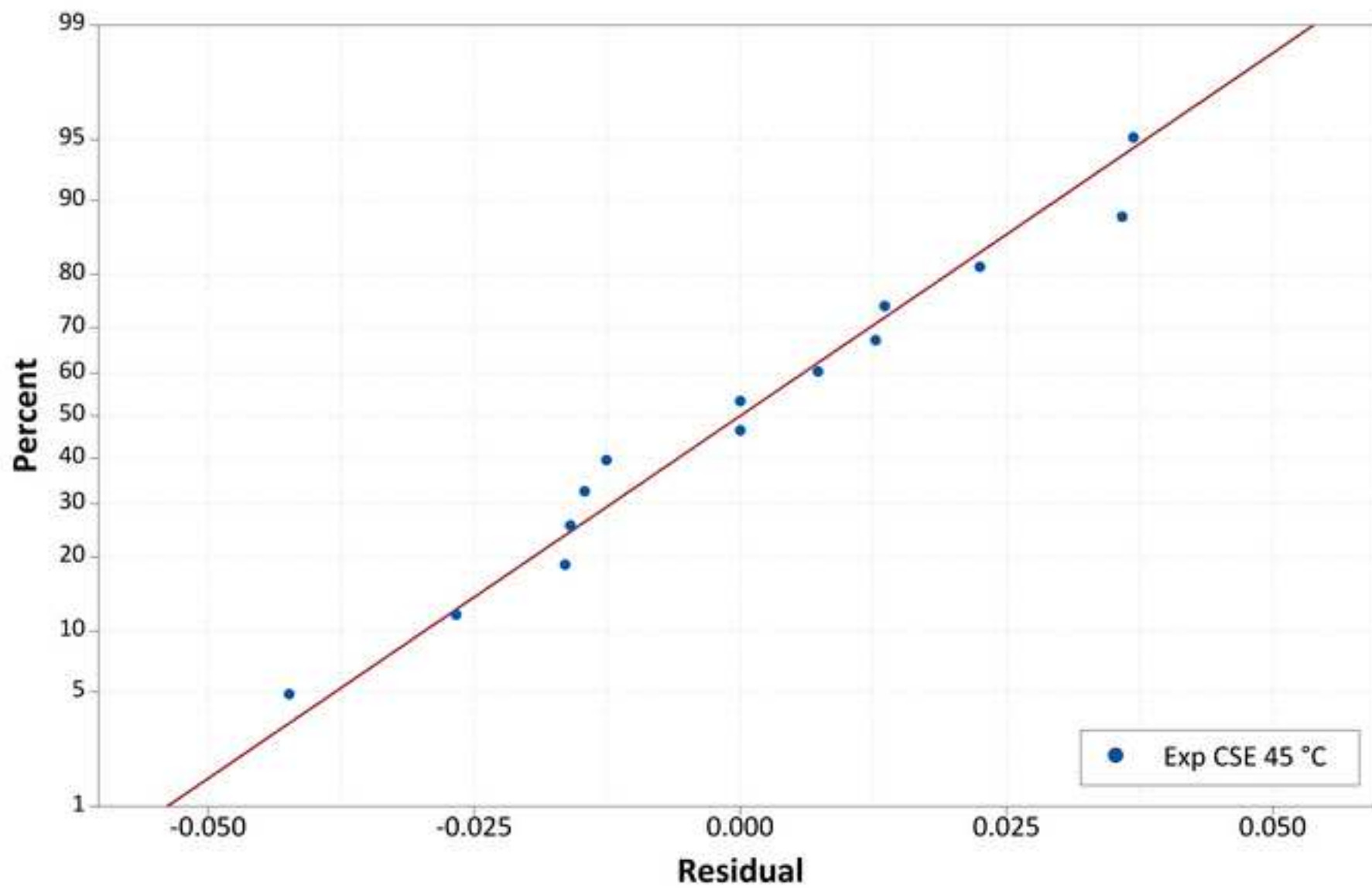


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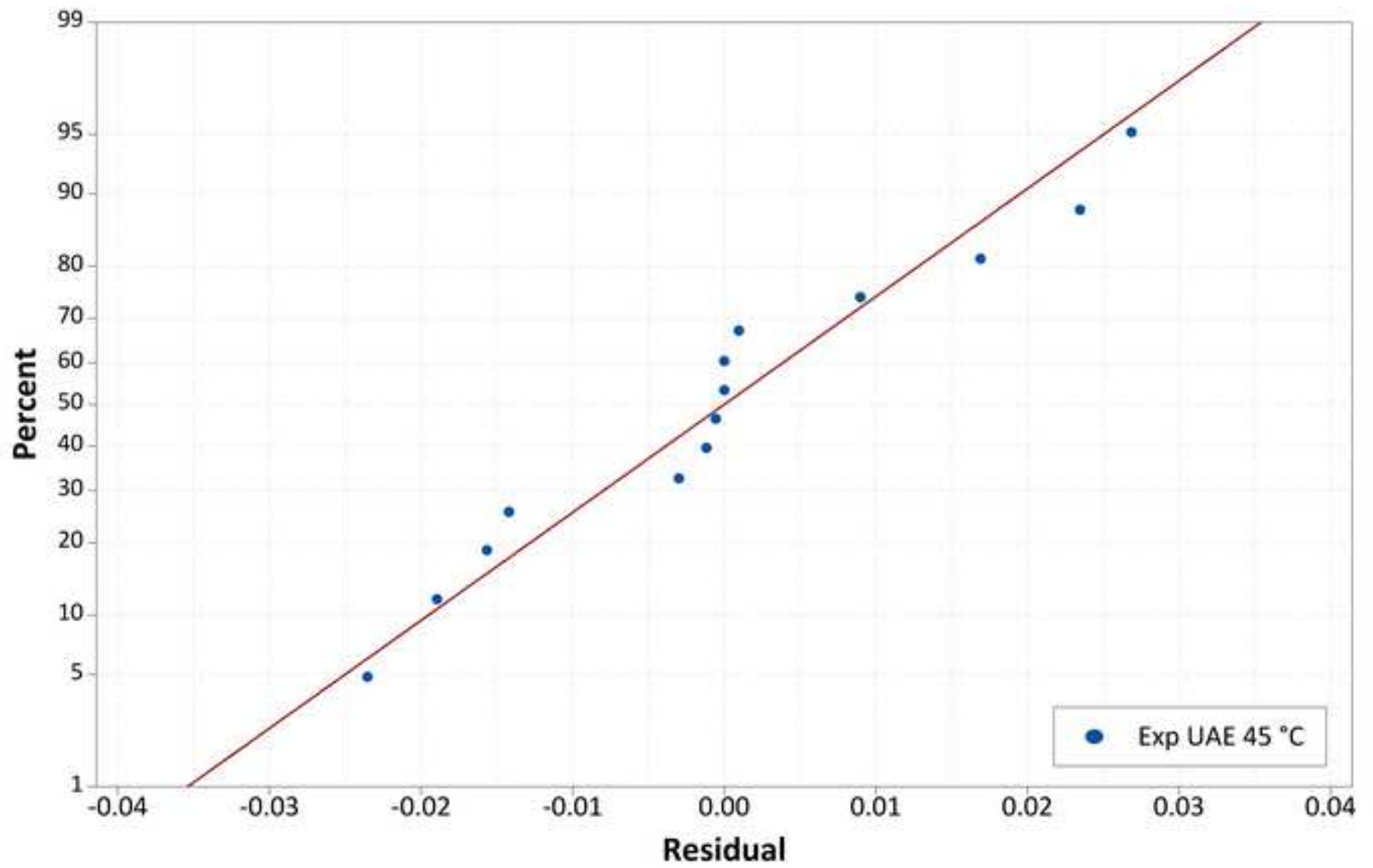


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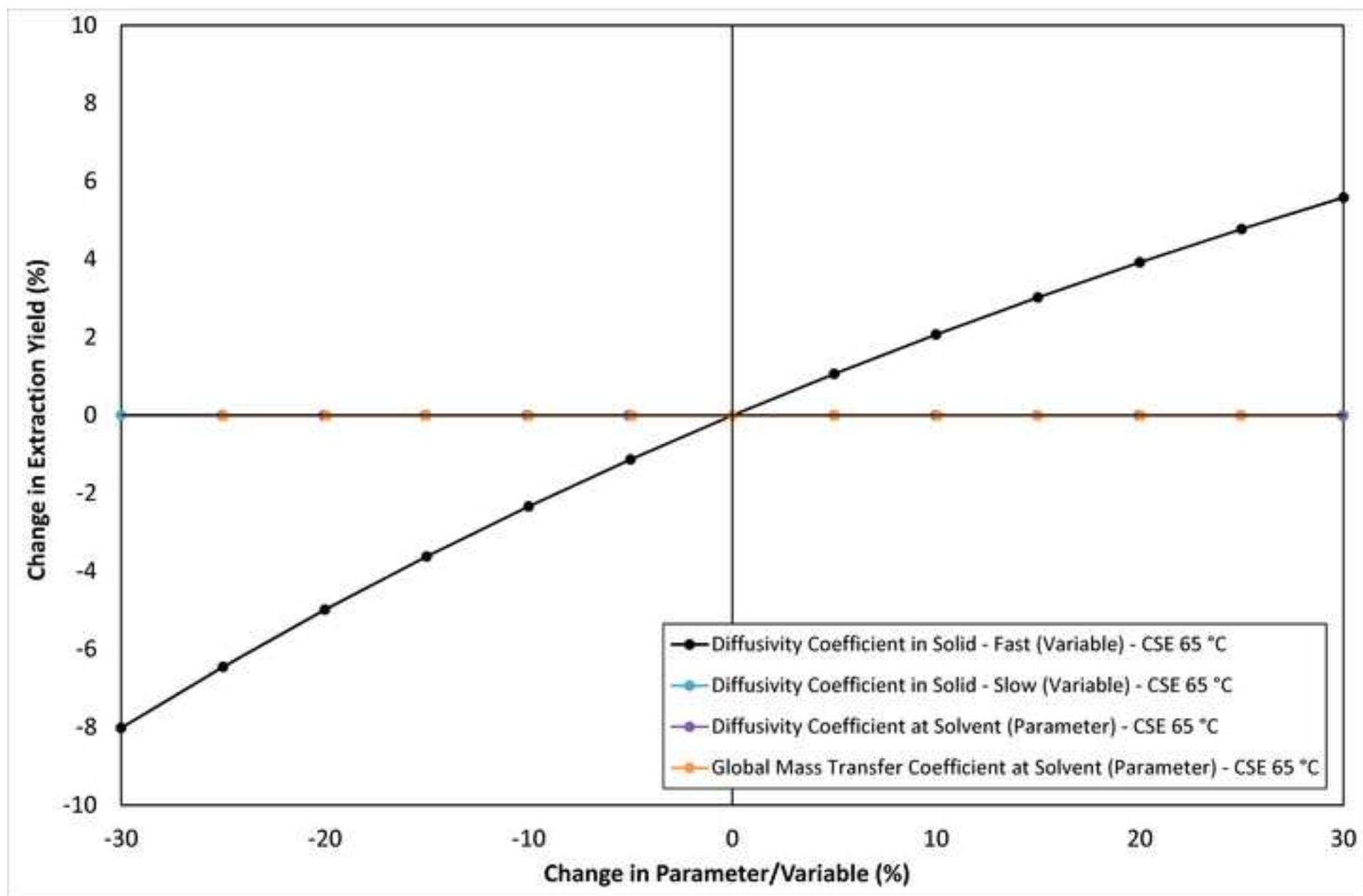


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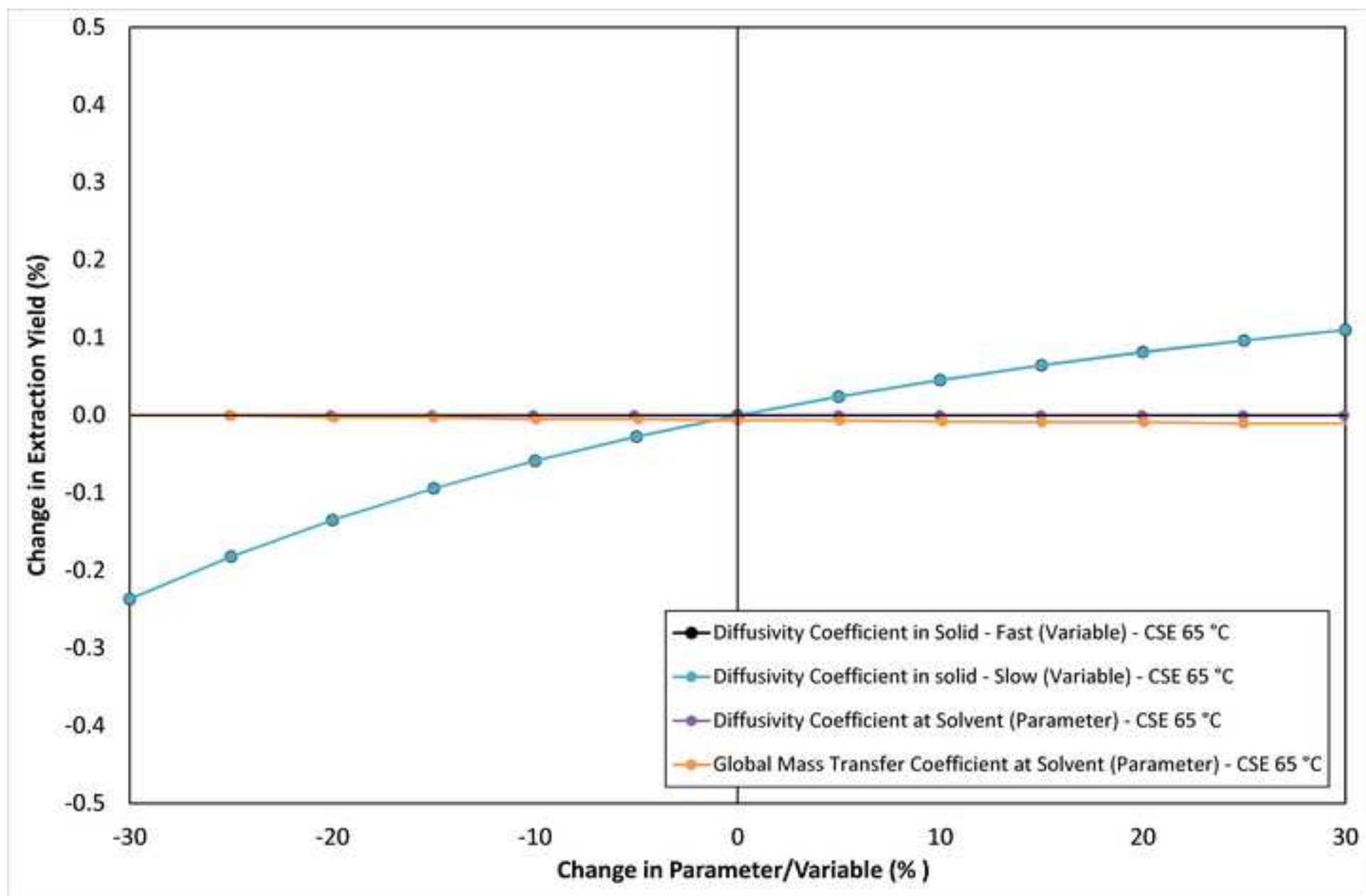


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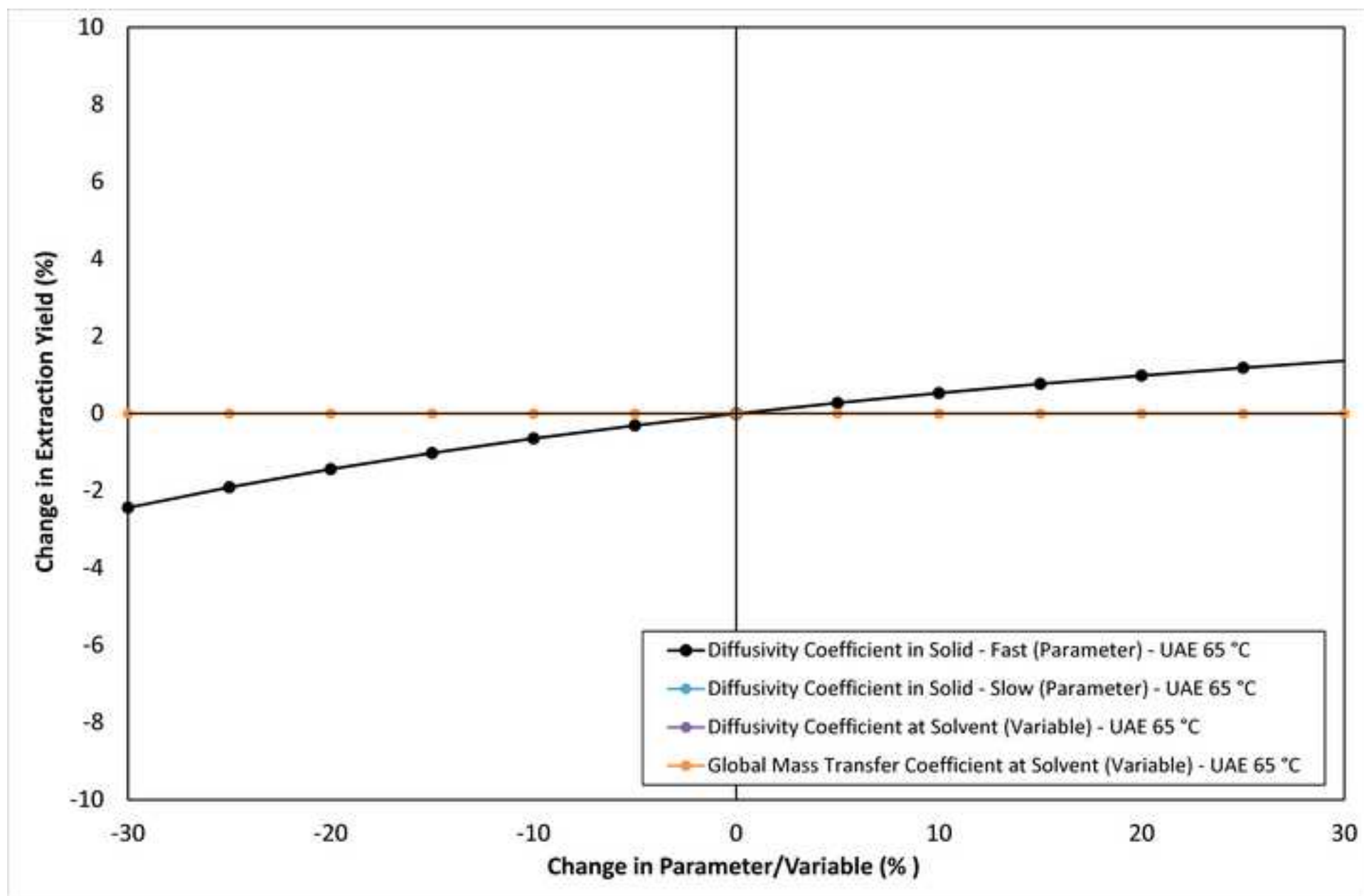


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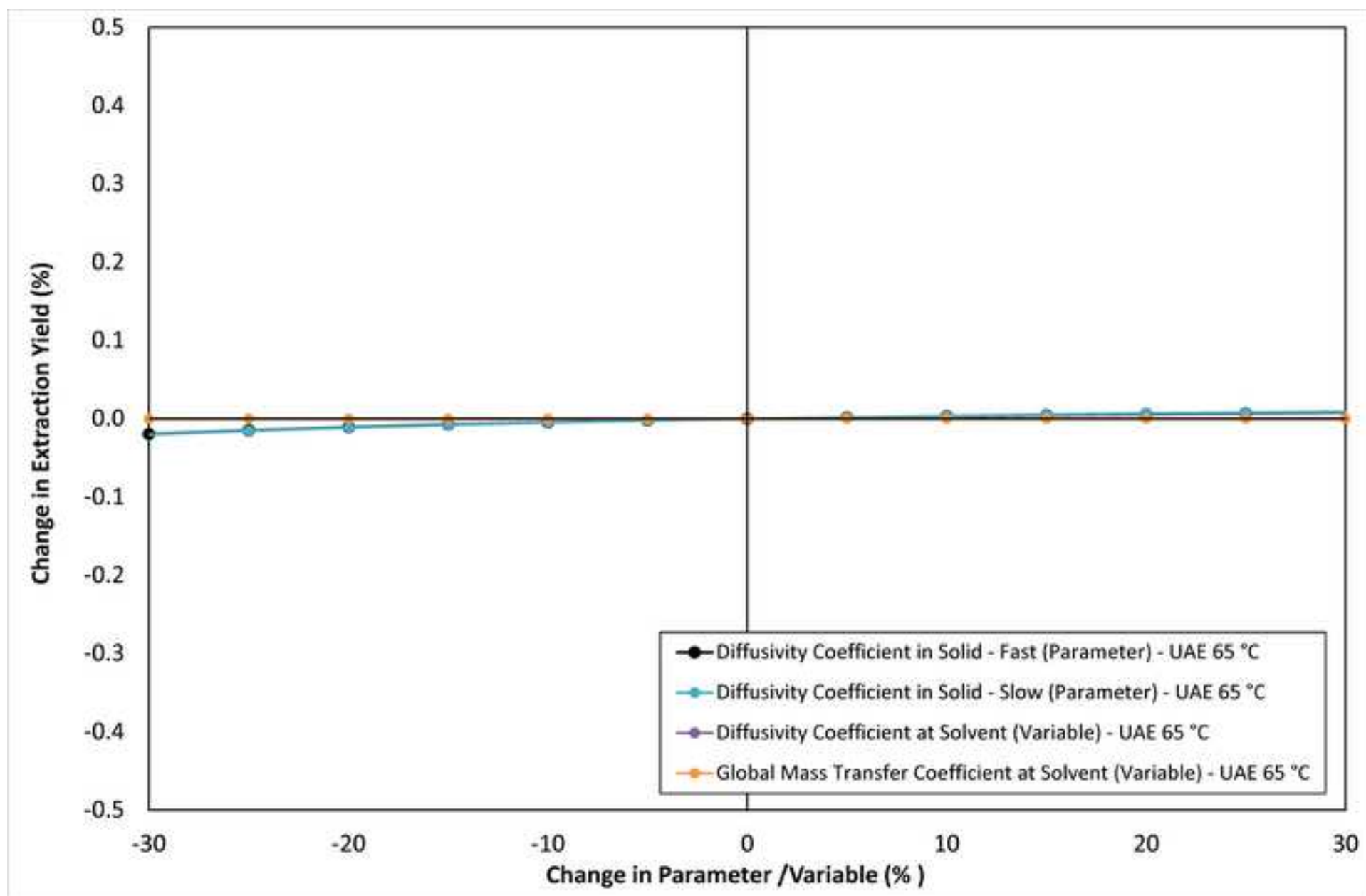


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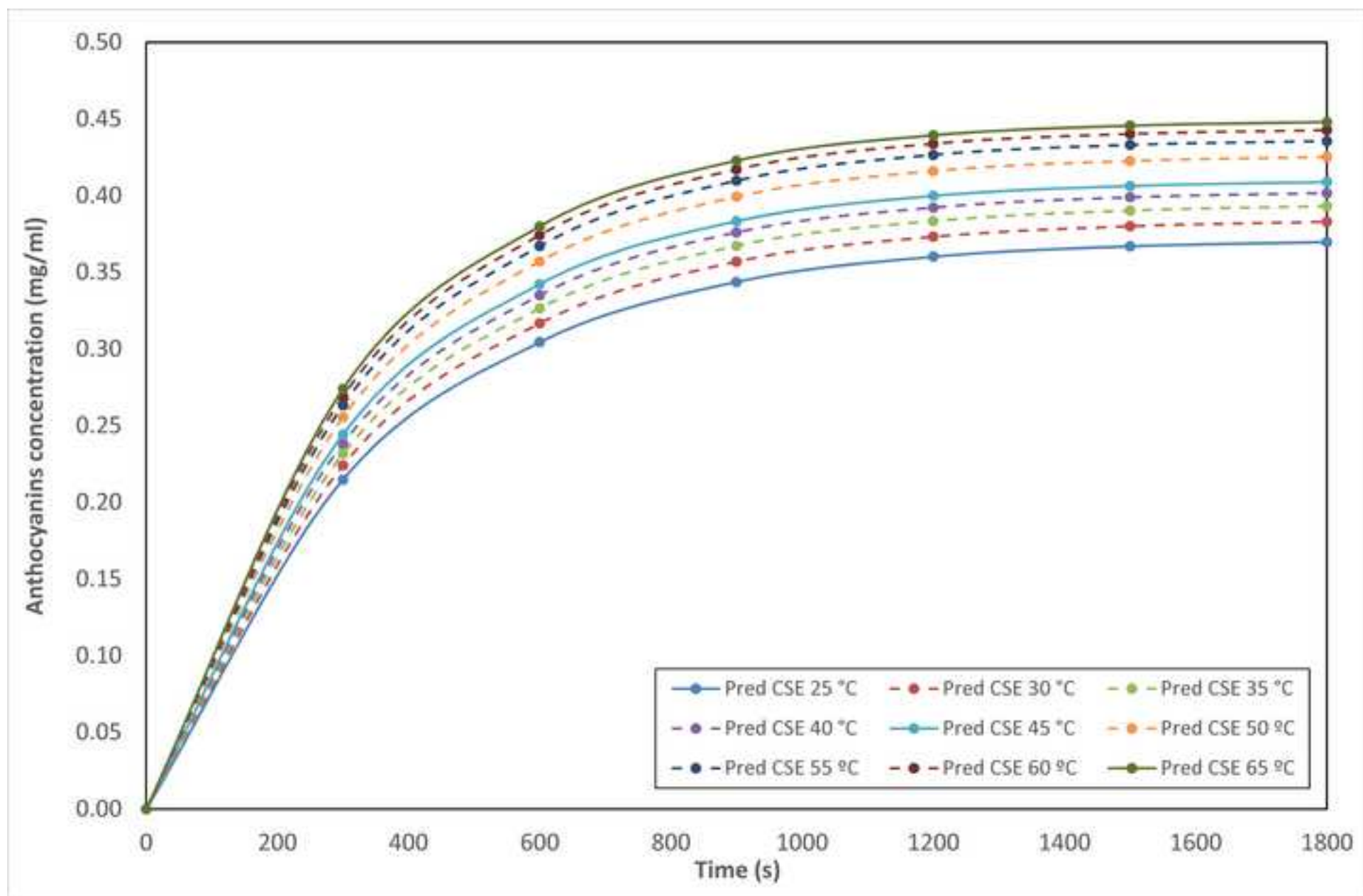


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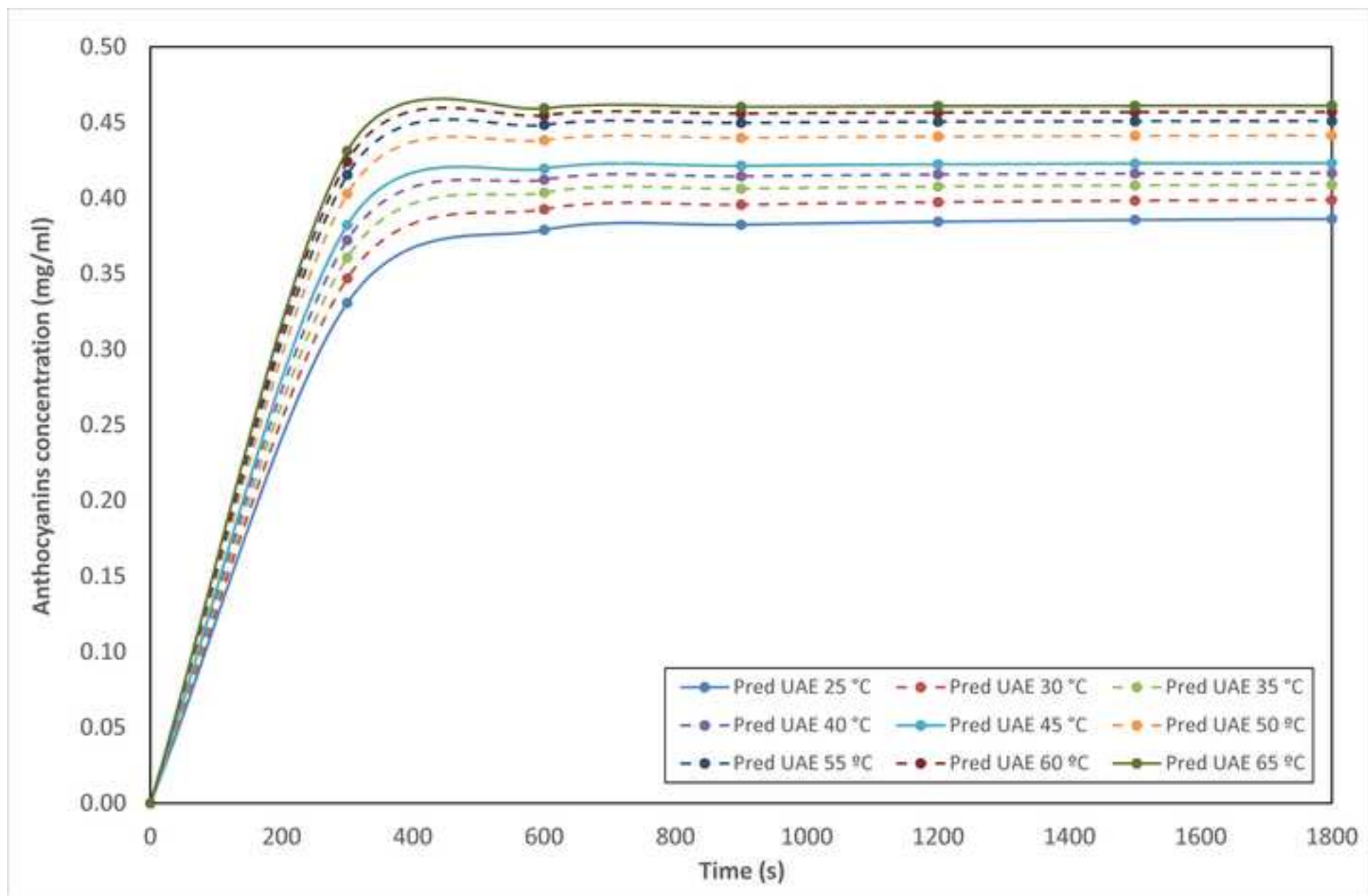




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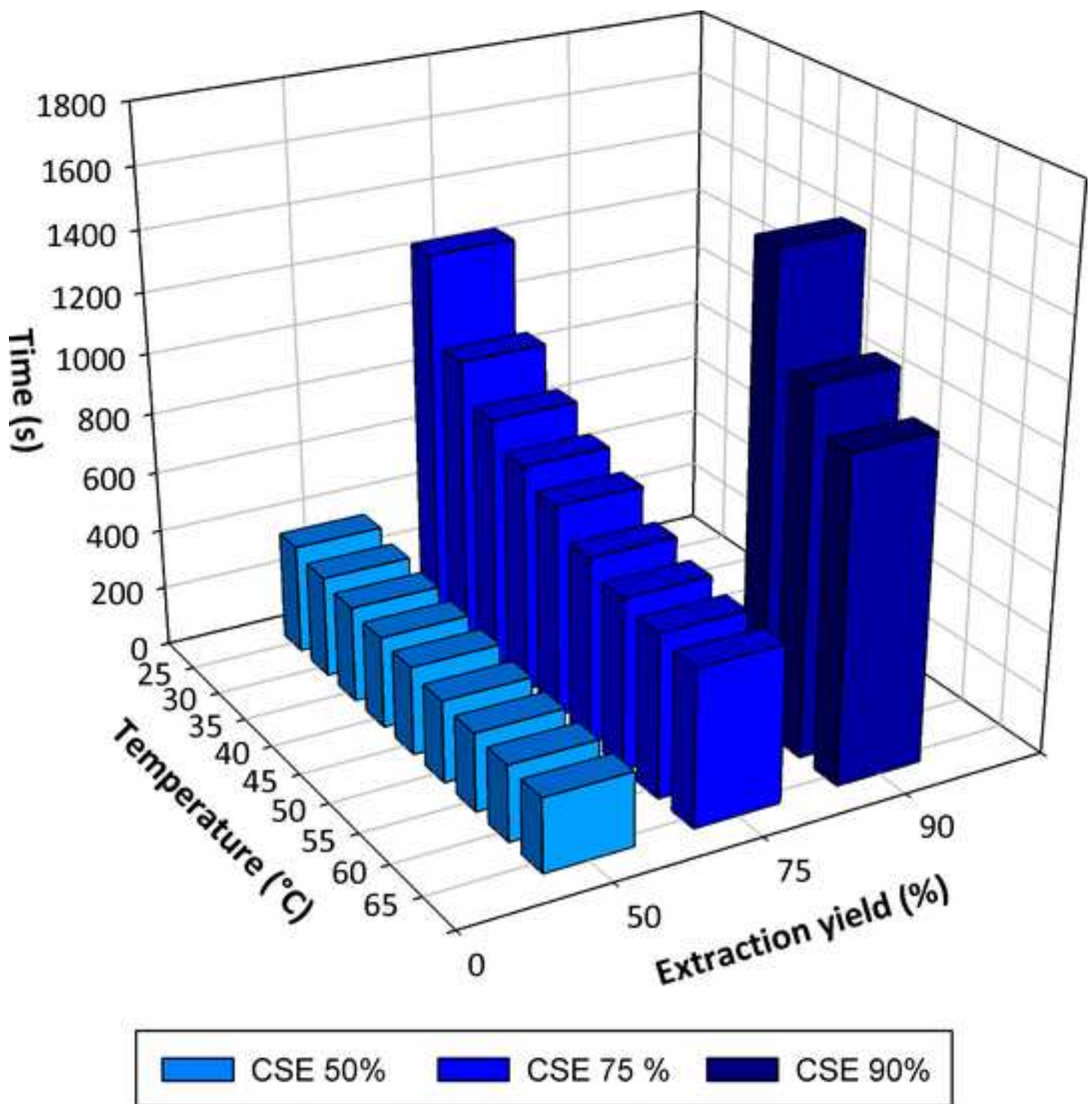


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