

1 **High-throughput log $P_{o/w}$ determination from UHPLC measurements:**
2 **revisiting the Chromatographic Hydrophobicity Index**

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8 *Dedicated to Professor Roman Kaliszan on the occasion of his 70th birthday.*

9
10 **Abstract**

11 A fast and accurate lipophilicity determination is fundamental in the drug discovery process,
12 as long as it is a relevant property in the absorption, distribution, metabolism, excretion and
13 toxicity (ADMET) of a potential drug substance. In the present work, different models based
14 on chromatographic retention values for a large set of compounds and some of their molecular
15 descriptors (calculated by ACD/Labs or CODESSA programs) have been examined in order
16 to establish reliable equations for log $P_{o/w}$ determination from fast chromatographic
17 hydrophobicity index (CHI) measurements. This appears to be a very interesting high-
18 throughput methodology for screening purposes, since CHI values can be measured by
19 UHPLC in very short runs (< 4 min) and molecular descriptors can be easily computed from
20 the structure of any compound. The selected final descriptors were Abraham's hydrogen-bond
21 acidity (A) and excess molar refraction (E) from ACD/Labs, and hydrogen-bond acidity
22 HDCA-1/TMSA and HOMO-LUMO polarizability descriptors from CODESSA software.
23 The proposed equations allow an accurate determination of log $P_{o/w}$ with standard errors in
24 the range of 0.4 units.

25
26 **Keywords**

27 Lipophilicity; partition coefficient; partition ratio; log $P_{o/w}$; chromatographic hydrophobicity
28 index; CHI; molecular descriptors.

29
30 **Highlights**

31 A high-throughput log $P_{o/w}$ determination approach is proposed in the present work.
32 It is based on fast UHPLC CHI measurements and molecular descriptors.
33 Molecular descriptors were calculated from ACD/Labs (Abraham) and CODESSA.

34 Accurate determination of $\log P_{o/w}$ with standard errors in the range of 0.4 is achieved.

35

36 **1. Introduction**

37 It is widely accepted that lipophilicity plays a fundamental role in the estimation of the
38 ADMET properties (absorption, distribution, metabolism, excretion, and toxicity) of a drug
39 candidate. A simple search in SciFinder reveals more than 20 thousand hits for the keyword
40 ‘lipophilicity’ in the period comprised between 2010 and 2015. Therefore, it seems very
41 convenient to establish high-throughput, reliable and accurate methodologies to determine
42 lipophilicity in the frame of the drug discovery process.

43 The most widely used lipophilicity index is the logarithm of the 1-octanol/water
44 partition coefficient ($\log P_{o/w}$), traditionally measured by equilibrating the compound in this
45 two-phase system in a shake-flask for a relatively long period of time (3 to 24h), followed by
46 the determination of the concentration of the compound in the partition phases by
47 spectrometry or liquid chromatography [1-4]. This method, although being the reference one,
48 is very time consuming and require a high purity of sample. In order to overcome these
49 limitations, a high-throughput Chromatographic Hydrophobicity Index (CHI) was proposed
50 by Valkó [5, 6] based on the retention times measured in a fast gradient reversed-phase HPLC
51 method. The main advantages of CHI in relation to former chromatographic lipophilicity
52 indexes, besides the rapidness of the measurements, were its independency of the column
53 dimensions, the particular fast gradient programmed and the flow-rate. Therefore, when the
54 nature of the stationary phase is maintained (e.g. C18), the CHI value of a compound can be
55 measured in any column, independently of its length, wide or particle size. However, this
56 index depends on the particular organic modifier employed (acetonitrile, methanol), the
57 temperature and, for acidic or basic compounds, the pH of the mobile phase. A few years later
58 and in collaboration with Abraham, the correlations between $\log P_{o/w}$ and CHI and
59 lipophilicity indexes were improved using acetonitrile (MeCN) as organic modifier and
60 including experimentally determined hydrogen-bond acidity descriptors in the correlation
61 equations [7, 8].

62 The method of Abraham relates a solvation property (SP) with the sum of specific
63 interactions terms:

$$64 \log SP = c + eE + sS + aA + bB + vV \quad (1)$$

65 where E , S , A , B , and V are the solute descriptors, and c , e , s , a , b , and v are the system
66 constants. Briefly, E is the excess molar refraction (i.e. difference between the molar

67 refraction of a particular solute and that of an alkane of equivalent volume) which models the
68 dispersion force interactions arising from the greater polarizability of π and n electrons, S
69 accounts for the solute dipolarity/polarizability due to interactions between dipoles and
70 induced dipoles, A and B are the solute hydrogen-bond acidity and basicity descriptors,
71 respectively, and V is the McGowan's volume of the molecule. The coefficients c , e , s , a , b ,
72 and ν reflect the complementary effect of the solute descriptors on the solvent phases,
73 providing chemical information that allows the characterization of the system [9]. Using this
74 approach, a very reliable $\log P_{o/w}$ equation was built by Abraham from the experimental data
75 ($\log P_{o/w}$, and molecular descriptors) of more than six hundred compounds [10].

76 In the present study the correlations between $\log P_{o/w}$ and the CHI values, measured by
77 Valkó using a C18 HPLC stationary phase and acetonitrile as organic modifier (CHI_{MeCN}) [7],
78 have been revisited using calculated molecular descriptors instead of the experimental ones
79 used in the original work. Computed descriptors, although less accurate than those
80 experimentally obtained, can be calculated for any compound from its structure investing a
81 short time, which seems very convenient for screening purposes in drug discovery processes.
82 Finally, $\log P_{o/w}$ values were determined for a set of test compounds by means of the
83 established equations, whose CHI_{MeCN} values were measured by an even faster UHPLC
84 method. Besides a lower consumption of mobile phase solvents (0.5 mL/min) in relation to
85 former HPLC methodologies, UHPLC technology provides high resolutions in short runs (3.1
86 minutes in the present work) and very short equilibration times within consecutive gradients
87 (0.7 minutes).

88

89

90 **2. Material and methods**

91 2.1. Calculation of the descriptors

92 2.1.1. Abraham two-dimensional descriptors

93 The values of the solvation parameter model descriptors were calculated using the
94 ACD/Absolv module of the ACD/Percepta platform (Advanced Chemistry Development, Inc.
95 (ACD/Labs), Toronto, ON, Canada). According to this 2D approach, a particular descriptor is
96 obtained from the contributions of molecular fragments to the whole molecule property [11].

97 2.1.2. CODESSA three-dimensional descriptors

98 The structures were drawn using the HyperChem Lite software (HyperCube, Gainesville,
99 USA). The geometry optimization was performed with the semiempirical quantum method
100 AM1 using the MOPAC 6.0 and AuxQSPR programs in order to obtain the global energy

101 minimum. Thus, CODESSA software package (University of Florida, USA) was employed to
102 calculate the numeric values of the structural descriptors. Four different classes of molecular
103 descriptors were computed: hydrogen bonding, both donor and acceptor; geometrical, derived
104 from the 3D coordinates of the atoms; electrostatic, accounting for the charge distribution of
105 the molecule; and quantum-chemical, obtained from MOPAC calculations [12].

106

107 2.2 Chromatographic conditions

108 A Shimadzu (Kyoto, Japan) Nexera UHPLC system was used for CHI measurements. The
109 system was equipped with two LC-30AD high-pressure pumps, a DGU-20A5 online
110 degasser, a CTO-10ASvp oven thermostated at 25°C, a SIL-30AC autosampler, a SPD-
111 M20A diode array detector and a CBM-20Alite controller. Retention data were obtained from
112 a Waters (Milford, MA, USA) Acquity BEH C18 column, 1.7 μm , 50 mm \times 2.1 mm. Samples
113 were prepared in DMSO at a concentration of 0.5 mg/mL, and the injection volume was 0.2
114 μL . The percentage of MeCN in the fast gradient program was: 0.0-0.4 min, 0%; 0.4-2.5 min,
115 0-100%; 2.5-2.9 min, 100%; 2.9-3.1 min, 100-0%; 3.1-3.8 0% [13]. Aqueous buffers were, in
116 all cases, 50 mM ammonium acetate at the desired pH value. Acidic buffers were prepared
117 from glacial acetic acid and the pH was adjusted with small volumes of concentrated
118 ammonia (25%), and basic buffers were prepared inversely. Medium acidic and basic buffers
119 were obtained by solving the salt and adjusting the pH with concentrated ammonia or glacial
120 acetic acid. 4-hydroxybenzyl alcohol (pH<8) or caffeine (pH>8), acetanilide, acetophenone,
121 propiophenone, butyrophenone, valerophenone, hexanophenone, and heptanophenone were
122 used as calibration standards for CHI measurements.

123

124 2.3 Chemicals

125 Acetonitrile HPLC gradient grade was purchased from VWR (West Chester, PA, USA).
126 Water was purified by the Milli-Q[®] plus system from Millipore (Billerica, MA, USA) with a
127 resistivity of 18.2 M Ω ·cm. The chemicals used for buffer preparation were anhydrous sodium
128 acetate (>99.6%) and glacial acetic acid from J.T. Baker (Deventer, The Netherlands), and
129 ammonia from Merck (Darmstadt, Germany). Dimethyl sulfoxide (DMSO, >99.9%) was
130 purchased from J.T. Baker. The injected compounds were purchased from Merck, Sigma–
131 Aldrich and Fluka, or provided by Almirall (Barcelona, Spain), all of them in high purity
132 grade.

133

134 3. Results and discussion

135 3.1 Training set

136 The training set contained 125 structurally different substances with known $\log P_{o/w}$ [14] and
137 CHI_{MeCN} [7] values. It was selected to present a wide range of $\log P_{o/w}$, comprised between -
138 2.51 and 5.52, and, consequently, of CHI_{MeCN} values, from -23.0 to 128.4. The list of the
139 substances integrating the training set is available as supplementary material.

140

141 3.2 CHI and Abraham's descriptors

142 Abraham pointed out [15] that for certain solutes in water–solvent systems where the organic
143 layer contains considerable quantities of water, the solute hydrogen bond basicity (B) behave
144 in an anomalous way. This is precisely the case of mobile phases commonly used in reversed-
145 phase liquid chromatography. Affected solutes were those containing the S=O and P=O
146 (except sulfones, sulfonamides, sulfonates, and phosphates), anilines, and pyridines. With the
147 aim of solving this issue, Abraham assigned an alternative hydrogen bond basicity descriptor,
148 named B^0 . Therefore, in the present work B^0 has been used instead of B and, in fact, slightly
149 better correlations have been obtained.

150 According to Eq. (1), independent correlations between both lipophilicity indexes, \log
151 $P_{o/w}$ and CHI_{MeCN} , with molecular descriptors of the training set compounds have been
152 established. However, all the coefficients (e , s , a , b , and v) were normalized dividing each one
153 by the length of the coefficients vector (l):

154
$$l = \sqrt{e^2 + s^2 + a^2 + b^2 + v^2} \quad (2)$$

155 resulting in the following expressions $e_u = e/l$, $s_u = s/l$, $a_u = a/l$, $b_u = b/l$, and $v_u = v/l$,
156 where the subscript u denotes normalized coefficients (Table 1). From them, the comparison
157 between lipophilicity systems becomes very easy.

158 In the present work we have considered the measured $\log P_{o/w}$ and CHI_{MeCN} of 125
159 substances [7], but in this case the Abraham's molecular descriptors were calculated using the
160 ACD/Labs software. Since computed descriptors are expected to be less accurate than
161 experimental ones, they lead in fact to worse correlation coefficients (R) and higher standard
162 errors (SE) for lipophilicity equations. However, as presented in Table 1, the normalized
163 coefficients of $\log P_{o/w}$ system obtained from a huge set of experimental molecular descriptors
164 [10] are very similar to those calculated in the present work, suggesting that computed
165 descriptors provide a reasonable accuracy. In addition, both lipophilicity systems, $\log P_{o/w}$ and
166 CHI_{MeCN} , show similar normalized system coefficients and a very short distance between
167 normalized vectors ($d < 0.2$) [16], confirming the similarity between the studied systems. As

168 already pointed out by Valkó and co-workers [7], when comparing $\log P_{o/w}$ and CHI_{MeCN}
169 coefficients, the major difference lies on the hydrogen-bond basicity of the system (a). Notice
170 that the coefficients of Eq. (1) reflect the complementary property of the system related to the
171 solute. Thus, since A is the hydrogen-bond acidity descriptor of the solute, a is the difference
172 in hydrogen-bond basicity between stationary and mobile phases in the chromatographic
173 system, or between octanolic and aqueous phases in the $\log P_{o/w}$ system. Therefore, the
174 inclusion of a hydrogen-bond acidity descriptor of the solute is very convenient in the
175 determination of $\log P_{o/w}$ values from CHI_{MeCN} measurements. In addition, a minor difference
176 is found for the e coefficient, especially between the $\log P_{o/w}$ and CHI_{MeCN} solvation equations
177 built with calculated molecular descriptors.

178

179 3.3 CHI and CODESSA descriptors

180 In order to assay a model similar to that of Abraham, several molecular descriptors were
181 calculated by means of the CODESSA software accounting for (1) hydrogen-bonding donor
182 ability (HDCA, FHDCA, HDCA-1, HDCA-1/TMSA, HDCA-2, HDCA-2/TMSA, HDCA-
183 2/SQRT(TMSA), HDSA-1, HDSA-1/TMSA, HDSA-2, HDSA-2/TMSA, HDSA-
184 2/SQRT(TMSA), FHDSA, and count of H-donors sites); (2) hydrogen-bonding acceptor
185 ability (HACA-1, HACA-1/TMSA, HACA-2, HACA-2/TMSA, HACA-2/SQRT(TMSA),
186 FHACA, HACA, HASA-1, HASA-1/TMSA, HASA-2, HASA-2/TMSA, HASA-
187 2/SQRT(TMSA), HASA, FHASA, and count of H-acceptor sites); (3) polarity and
188 polarizability based intermolecular interactions (DPSA-1, DPSA-2, DPSA-3, PPSA-1, PNSA-
189 1, Polarity parameter, Polarity parameter/square distance (pol/d^2), HOMO - LUMO energy
190 gap, ALFA-, 1X BETA-, (1/2)X BETA-, 1X GAMMA-, and (1/6)X GAMMA polarizability);
191 and (4) molecular volume and surface area (TMSA). Further information about these
192 descriptors is available at the CODESSA PRO project website [17].

193 To improve the correlations between $\log P_{o/w}$ and CHI_{MeCN} , some descriptors
194 accounting for the above mentioned properties were selected because it was proved that they
195 allowed a successful explanation of the relationships between chromatographic retention and
196 octanol/water partition [7, 8, 18-20]. Then, mimicking Eq. (1) and with the aim of selecting
197 the best molecular descriptors, those accounting for hydrogen-bond acidity and basicity,
198 polarity, polarizability and volume, have been tested. Thus, multiple linear correlations
199 including only one descriptor at each time were calculated. The best descriptor of each
200 category has been included in Table 2, which also shows the improvement in the residual sum
201 of squares (SS_{res}) of the multilinear equations in relation to the original linear correlation

202 between $\log P_{o/w}$ and CHI_{MeCN} . Concerning the hydrogen-bond acidity of the solute, two
203 different Zefirov's PC descriptors showed a similar improvement, HDCA-1/TMSA and
204 HDCA-2/TMSA, being the former a 37% and the latter a 35%. In relation to hydrogen-bond
205 basicity, HACA-2/TMSA [Zefirov's PC] reduced the SS_{res} in a 21%. Finally, regarding
206 polarity and polarizability, the descriptors that allowed better correlations were DPSA-3
207 [Zefirov's PC] and HOMO-LUMO energy gap, with an improvement of SS_{res} of 13% and
208 10%, respectively. The consideration of the molecular volume or surface area descriptors
209 alone only represented a SS_{res} reduction of the 2% and, consequently, were not further
210 considered.

211 The above mentioned CODESSA descriptors were individually correlated among
212 them and with CHI_{MeCN} , in order to explore the ortogonality of the information provided by
213 each of the descriptors (Table 3). As expected HDCA-1/TMSA and HDCA-2/TMSA are
214 highly correlated ($r^2=0.986$), since they account for the same solute property (hydrogen-bond
215 acidity), but in a similar way of Abraham's approach, CHI_{MeCN} is poorly correlated with the
216 rest of descriptors ($r^2 \leq 0.6$). However, acidity and basicity hydrogen-bond descriptors are
217 correlated to some extent ($r^2 \leq 0.8$), suggesting that similar information is provided. It is
218 noteworthy that DPSA-3 and HOMO-LUMO are not correlated at all ($r^2 = 0$), and neither of
219 them are correlated with CHI_{MeCN} . ($r^2 < 0.1$).

220

221 3.4 Training set correlations: comparison between Abraham's (ACD/Labs) and CODESSA 222 descriptors

223 Several linear and multilinear correlations between $\log P_{o/w}$ vs. CHI_{MeCN} and molecular
224 descriptors performed with the 125 substances of the training set were tested. Note that \log
225 $P_{o/w}$ and CHI_{MeCN} correlations were published by Valkó [7] in 2001 using experimental values
226 for a set of 86 substances and a $\log P_{o/w}$ range comprised between -0.35 and 5.52, whereas in
227 the present work this range has been extended to -2.51 and molecular descriptors have been
228 calculated by both ACD/Labs and CODESSA programs. The simple linear correlation
229 between $\log P_{o/w}$ and CHI_{MeCN} leads to the following expression:

$$230 \log P_{o/w} = 0.046(\pm 0.002) \cdot CHI_{MeCN} - 0.81(\pm 0.11) \quad (3)$$

(N=125, $R^2=0.863$, $SE=0.50$, $SS_{res}=30.6$)

231 As expected from the comparison of $\log P_{o/w}$ and CHI_{MeCN} solvation equations, the addition of
232 Abraham's hydrogen-bond acidity descriptor (A) significantly enhances the correlation:

233 $\log P_{o/w} = 0.055(\pm 0.001) \cdot CHI_{MeCN} + 1.30(\pm 0.10) \cdot A - 1.85(\pm 0.11)$ (4)
 (N=125, R²=0.940, SE=0.33, SS_{res}=13.5)

234 This expression is nearly identical to that proposed by Valkó (
 235 $\log P_{o/w} = 0.054 \cdot CHI_{MeCN} + 1.319 \cdot A - 1.877$), despite Eq. (4) includes about a 50% more of
 236 compounds and calculated molecular descriptors instead of the experimental ones, showing in
 237 this way the robustness of the correlation. Furthermore, the addition of the excess molar
 238 refraction descriptor (*E*) improves the statistics of the equation, but only slightly:

239 $\log P_{o/w} = 0.054(\pm 0.001) \cdot CHI_{MeCN} + 1.24(\pm 0.10) \cdot A + 0.18(\pm 0.05) \cdot E - 2.02(\pm 0.12)$ (5)
 (N=125, R²=0.946, SE=0.32, SS_{res}=12.2)

240 In the case of CODESSA descriptors, the ones proposed in Table 2 were included in
 241 multilinear correlations between $\log P_{o/w}$ and CHI_{MeCN} , obtaining the following equations:

242 $\log P_{o/w} = 0.058(\pm 0.002) \cdot CHI_{MeCN} + 89.7(\pm 18.4) \cdot [HDCA - 1 / TMSA] -$
 $- 11.7(\pm 35.4) \cdot [HACA - 2 / TMSA] + 7.5(\pm 5.2) \cdot 10^{-3} \cdot [DPSA - 3] -$ (6)
 $- 0.15(\pm 0.04) \cdot [HOMO - LUMO] - 0.84(\pm 0.43)$
 (N=125, R²=0.924, SE=0.38, SS_{res}=17.0)

243 $\log P_{o/w} = 0.057(\pm 0.002) \cdot CHI_{MeCN} + 427(\pm 99) \cdot [HDCA - 2 / TMSA] +$
 $+ 5.5(\pm 38.8) \cdot [HACA - 2 / TMSA] + 5.3(\pm 5.4) \cdot 10^{-3} \cdot [DPSA - 3] -$ (7)
 $- 0.15(\pm 0.04) \cdot [HOMO - LUMO] - 0.69(\pm 0.43)$
 (N=125, R²=0.922, SE=0.38, SS_{res}=17.6)

244 It should be noticed that the only difference between Eq. (6) and (7) is the hydrogen-
 245 bond acidity descriptor. Although hydrogen-bond basicity (HACA-2/TMSA) and polarity
 246 (DPSA-3) improved individual correlations between $\log P_{o/w}$ and CHI_{MeCN} (Table 2), they
 247 become irrelevant in Eqs. (6) and (7) because of the magnitude of the errors associated to the
 248 coefficients. Therefore, taking into account that correlations with HDCA-1/TMSA as
 249 hydrogen-bond acidity descriptor are slightly better, a new expression was proposed
 250 excluding HACA-2/TMSA and DPSA-3:

251 $\log P_{o/w} = 0.059(\pm 0.002) \cdot CHI_{MeCN} + 103.0(\pm 12.1) \cdot [HDCA - 1 / TMSA] -$
 $- 0.15(\pm 0.04) \cdot [HOMO - LUMO] - 0.80(\pm 0.43)$ (8)
 (N=125, R²=0.922, SE=0.38, SS_{res}=17.5)

252 These findings are consistent with the expression reported by Pallicer *et al.* [12] in the
 253 determination of $\log P_{o/w}$ from chromatographic measurements by means of the polarity
 254 model.

255 In summary, Eq. (5) shows the best correlation between $\log P_{o/w}$ and CHI_{MeCN} , with a
256 standard error (*SE*) of only 0.32 $\log P_{o/w}$ units. In fact, it is a tiny improvement in relation to
257 Eq. (4), but as long as the time required for the calculation of the *A* descriptor alone or all of
258 them is nearly the same (only seconds of difference), it seems interesting to consider Eq. (4)
259 as well. On the other hand, the correlations using CODESSA descriptors are statistically very
260 similar and, consequently, it seems reasonable to keep the one with a less number of
261 molecular descriptors, that is Eq. (8). Finally, since the suppression of the HOMO-LUMO
262 term provides statistic parameters similar to those of Eq. (4), the simpler expression should be
263 considered too:

$$264 \log P_{o/w} = 0.060(\pm 0.002) \cdot CHI_{MeCN} + 107.4(\pm 12.7) \cdot [HDCA - 1 / TMSA] - 2.22(\pm 0.19) \quad (9)$$

(N=125, R²=0.914, SE=0.40, SS_{res}=19.3)

265 3.5 Test set correlations ACD vs CODESSA descriptors

266 A representative set of 43 structurally different compounds of pharmaceutical interest with
267 $\log P_{o/w}$ values in the range between -0.07 and 4.45 were selected as test set. In this occasion
268 CHI_{MeCN} were determined by UHPLC, because besides the lower mobile phase consumption
269 it provides better resolutions in shorter analysis times (< 4min). It must be pointed out that
270 CHI_{MeCN} values considered in the training set correlations were measured using a HPLC Luna
271 C18(2) column, whereas CHI_{MeCN} values of the test set in the present work have been
272 determined employing a UHPLC Acquity BEH C18 column. Although both columns have the
273 same octadecilsilane stationary phase, which is the main responsible for the chromatographic
274 behavior of the analytes, the support technology might affect the retention in some extent. The
275 measured CHI_{MeCN} values, together with the Abraham (ACD/Labs) and CODESSA molecular
276 descriptors are shown in Table 4. The $\log P_{o/w}$ values were directly calculated from CHI_{MeCN}
277 measurements using multilinear correlations involving solute descriptors according to Eqs.
278 (4), (5), (8), and (9). Figure 1 shows the correlations between literature and obtained $\log P_{o/w}$
279 values, and the built linear regressions present, in all cases, slopes very close to unity and
280 slightly negative intercepts not significantly different to zero at 95% confidence level. Among
281 the solute hydrogen-bond acidity descriptors, calculated *A* (Eq. (4)) and HDCA-1/TMSA (Eq.
282 (9)), conduct to comparable results with similar $\log P_{o/w}$ predictive capacity from CHI_{MeCN}
283 measurements, but leading the CODESSA descriptor to a slightly better correlation in terms
284 of intercept and mean of residuals (MR) closer to zero, and lower root mean square error
285 (RMSE). About 75% of the studied compounds are in $\log P_{o/w} \pm 0.5$ range according to the
286

287 literature values, and major deviations were found for some bases (2,4-lutidine, lidocaine, and
288 papaverine, labeled in Figure 1 as 5, 12, and 14, respectively). In the case of ketoconazole
289 (labeled as 11), the CODESSA descriptor allows a better prediction of $\log P_{o/w}$ lipophilicity,
290 probably due to more precisely calculation of the hydrogen-bond acidity of the molecule.
291 Finally, the addition of E (Eq. (5)) or HOMO-LUMO (Eq. (8)) descriptors slightly improve
292 the correlations between reference and estimated $\log P_{o/w}$ values. In summary, both
293 ACD/Labs and CODESSA descriptors lead to equations which exhibit comparable predictive
294 capacity, and any of them can be recommended for the high-throughput determination of \log
295 $P_{o/w}$ values from CHI_{MeCN} measurements. However, the calculation of Abraham descriptors is
296 simpler and less time consuming, since they do not require the 3D optimization step of the
297 molecular structure before computing the descriptor value and, then, this approach is
298 recommended for everyday work

299

300 **4. Conclusions**

301 Lipophilicity $\log P_{o/w}$ values can be accurately determined from fast gradient chromatographic
302 measurements (CHI_{MeCN}) and the Abraham's hydrogen-bond acidity (A) and excess molar
303 refractivity (E) descriptors. Alternatively, the CODESSA descriptors accounting for
304 hydrogen-bond acidity HDCA-1/TMSA and polarizability HOMO-LUMO also improve the
305 correlations between $\log P_{o/w}$ and CHI_{MeCN} in a similar extent. Since CHI_{MeCN} measurements
306 can be performed by UHPLC within 4 minutes and Abraham descriptors can be rapidly
307 computed from molecular structures using the ACD/Labs software, the proposed
308 methodology seems to be very convenient for high-throughput lipophilicity determination in
309 the frame of drug discovery process.

310

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314 providing the compounds of pharmaceutical interest included in the present work.

315

316 **Conflict of interest statement**

317 The authors declare no conflict of interest.

318

319 **Figure caption**

320

321 **Figure 1.** Correlations between literature and $\log P_{o/w}$ determined in the present work from
322 CHI_{MeCN} measurements and molecular descriptors computed from ACD/Labs (Eqs. (4) and
323 (5)) and CODESSA (Eqs. (8) and (9)) software. Slope, intercept, mean of residuals (MR) and
324 root mean square error (RMSE) of the correlations are also shown, with standard deviations in
325 parentheses. Solid line of unitary slope indicates the total correspondence between pairs of
326 values, dashed and dotted lines represents deviations of ± 0.5 and $\pm 1.0 \log P_{o/w}$ units,
327 respectively.

328

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TABLES

Table 1. Normalized coefficients for $\log P_{o/w}$ and CHI_{MeCN} solvation equation obtained from experimental and calculated molecular descriptors, and d distance accounting for system similarity.

| | e_u | s_u | a_u | b_u | v_u | d | N | R | SE |
|---|-------|-------|-------|-------|-------|-------|-----|-------|------|
| $\log P_{o/w}$ ^a | 0.11 | -0.20 | 0.01 | -0.65 | 0.72 | 0.000 | 613 | 0.997 | 0.12 |
| $\log P_{o/w}$ ^b | 0.20 | -0.24 | 0.13 | -0.69 | 0.64 | 0.181 | 125 | 0.937 | 0.50 |
| CHI_{MeCN} ^b | 0.12 | -0.24 | -0.17 | -0.67 | 0.67 | 0.193 | 125 | 0.929 | 10.3 |

^aCalculated from experimental descriptors (ref. [10]).

^bThis work, calculated from computed descriptors.

Table 2. Determination coefficients (R^2), standard errors (SE) and residuals sum of squares (SS_{res}) of multiple linear regressions between $\log P_{o/w}$, CHI_{MeCN} and the indicated molecular descriptor for the training set ($N=125$). The improvement (%) in relation to simple linear regression between $\log P_{o/w}$ and CHI_{MeCN} is also shown.

| | HDCA-1 /TMSA | HDCA-2 /TMSA | HACA-2 /TMSA | DPSA-3 | HOMO- LUMO |
|-------------------|-----------------|-----------------|-----------------|--------------|---------------|
| R^2 | 0.913 (5.9%) | 0.911 (5.6%) | 0.892 (3.4%) | 0.881 (2.1%) | 0.877 (1.6%) |
| SE | 0.40 (20.2%) | 0.40 (19.2%) | 0.45 (10.8%) | 0.47 (6.3%) | 0.48 (4.8%) |
| SS_{res} | 19.6 (36.8%) | 20.1 (35.2%) | 24.5 (21.1%) | 27.0 (12.9%) | 27.9 (10.2%) |

Table 3. Determination coefficients (r^2) of simple linear regressions between CHI_{MeCN} values and molecular descriptors of the training set ($N=125$) obtained from CODESSA software.

| <i>CODESSA</i> | CHI_{MeCN} | HDCA-1 /TMSA | HDCA-2 /TMSA | HACA-2 /TMSA | DPSA-3 | HOMO- LUMO |
|----------------------------|----------------------------|-----------------|-----------------|-----------------|--------|---------------|
| CHI_{MeCN} | 1.000 | 0.593 | 0.563 | 0.456 | 0.083 | 0.004 |
| HDCA-1/TMSA | 0.593 | 1.000 | 0.986 | 0.757 | 0.240 | 0.000 |
| HDCA-2/TMSA | 0.563 | 0.986 | 1.000 | 0.799 | 0.289 | 0.000 |
| HACA-2/TMSA | 0.456 | 0.757 | 0.799 | 1.000 | 0.273 | 0.002 |
| DPSA-3 | 0.083 | 0.240 | 0.289 | 0.273 | 1.000 | 0.000 |
| HOMO-LUMO | 0.004 | 0.000 | 0.000 | 0.002 | 0.000 | 1.000 |

Table 4. Experimental CHI_{MeCN} and calculated molecular descriptors for the test set compounds.

| Ref. | | Compound | A | E | HDCA-1 ($\times 10^{-3}$) | HOMO- LUMO | CHI_{MeCN} | |
|------|----------------|-------------------------|--------------|------|--------------------------------|---------------|----------------------------|-------|
| 1 | Acidic | Benzoic acid | 0.57 | 0.75 | 8.22 | 9.62 | 48.0 | |
| 2 | | Indomethacin | 0.57 | 2.44 | 2.85 | 7.90 | 90.7 | |
| 3 | | Salicylic acid | 0.70 | 0.91 | 9.92 | 8.91 | 46.0 | |
| 4 | Basic | 2,4,6-Trimethylpyridine | 0.00 | 0.67 | 1.25 | 9.61 | 57.2 | |
| 5 | | 2,4-Lutidine | 0.00 | 0.65 | 1.43 | 9.79 | 49.4 | |
| 6 | | Atenolol | 0.78 | 1.48 | 7.38 | 9.26 | 32.1 | |
| 7 | | Bupivacaine | 0.26 | 1.32 | 2.01 | 9.14 | 101.8 | |
| 8 | | Clonidine | 0.42 | 1.48 | 5.73 | 8.89 | 51.3 | |
| 9 | | Colchicine | 0.26 | 2.17 | 3.43 | 7.99 | 43.9 | |
| 10 | | Haloperidol | 0.31 | 2.00 | 3.44 | 8.42 | 88.9 | |
| 11 | | Ketoconazole | 0.00 | 3.14 | 3.80 | 8.59 | 83.9 | |
| 12 | | Lidocaine | 0.26 | 1.10 | 2.52 | 9.13 | 86.4 | |
| 13 | | Metoprolol | 0.29 | 1.10 | 3.54 | 9.35 | 61.5 | |
| 14 | | Papaverine | 0.00 | 2.19 | 1.70 | 8.19 | 66.9 | |
| 15 | | Phenobarbital | 0.52 | 1.56 | 10.13 | 9.73 | 51.8 | |
| 16 | | Phenothiazine | 0.13 | 1.95 | 1.77 | 7.34 | 98.4 | |
| 17 | | Pilocarpine | 0.00 | 1.02 | 4.04 | 9.71 | 20.9 | |
| 18 | | Procaine | 0.23 | 1.11 | 4.10 | 8.67 | 62.9 | |
| 19 | | Propranolol | 0.29 | 1.76 | 4.17 | 8.26 | 80.9 | |
| 20 | | Quinine | 0.23 | 2.41 | 5.78 | 8.31 | 66.4 | |
| 21 | | Reserpine | 0.31 | 3.10 | 1.12 | 7.38 | 98.7 | |
| 22 | | Theophylline | 0.35 | 1.46 | 12.53 | 8.70 | 21.4 | |
| 23 | | Trazodone | 0.00 | 2.64 | 2.94 | 7.95 | 76.3 | |
| 24 | | Neutral | Acetanilide | 0.41 | 0.89 | 4.42 | 9.01 | 40.7 |
| 25 | | | Acetophenone | 0.00 | 0.79 | 1.72 | 9.57 | 62.5 |
| 26 | | | Anthracene | 0.00 | 1.99 | 0.00 | 7.28 | 112.3 |
| 27 | Butyrophenone | | 0.00 | 0.79 | 0.84 | 9.58 | 87.9 | |
| 28 | Caffeine | | 0.00 | 1.48 | 9.55 | 8.61 | 25.9 | |
| 29 | Heptanophenone | | 0.00 | 0.78 | 0.61 | 9.58 | 112.1 | |
| 30 | Hexanophenone | | 0.00 | 0.78 | 0.66 | 9.58 | 105.2 | |
| 31 | Hydrocortisone | | 0.73 | 2.04 | 10.67 | 10.01 | 50.3 | |
| 32 | Naphthalene | | 0.00 | 1.27 | 0.00 | 8.45 | 97.5 | |
| 33 | Propiophenone | | 0.00 | 0.79 | 1.16 | 9.58 | 77.2 | |
| 34 | Valerophenone | | 0.00 | 0.79 | 0.73 | 9.58 | 97.0 | |
| 35 | Phenolic | 2-Chlorophenol | 0.33 | 0.85 | 4.66 | 9.29 | 63.6 | |
| 36 | | 3,5-Dinitrophenol | 0.83 | 1.32 | 6.37 | 8.68 | 86.0 | |
| 37 | | 4-Hydroxybenzaldehyde | 0.66 | 1.04 | 9.92 | 9.04 | 38.4 | |
| 38 | | 4-Nitrophenol | 0.67 | 1.05 | 6.07 | 9.01 | 55.3 | |
| 39 | | Methylparaben | 0.66 | 0.87 | 5.24 | 9.14 | 52.3 | |
| 40 | | Paracetamol | 0.91 | 1.12 | 10.13 | 8.66 | 21.2 | |
| 41 | | Thymol | 0.50 | 0.84 | 0.85 | 9.28 | 90.0 | |
| 42 | | Vanillin | 0.44 | 1.02 | 7.70 | 8.92 | 41.4 | |
| 43 | | Warfarin | 0.31 | 1.98 | 0.01 | 8.40 | 82.9 | |

