# Application of the Semi-Empirical Topological Index in Quantitative Structure-Chromatographic Retention Relationship (QSRR) Studies of Aliphatic Ketones and Aldehydes on Stationary Phases of Different Polarity

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O índice semi-empírico topológico, desenvolvido previamente por Heinzen e Yunes, foi aplicado para predizer a retenção cromatográfica de cetonas e aldeídos alifáticos, em fases estacionárias de diferentes polaridades (HP-1, HP-50, DB-210 e Innowax). Foram estabelecidas regressões lineares simples entre os índices de retenção experimentais e os índices semi-empíricos topológicos ( $RI_{Exp}$  = a +  $bI_{ET}$ ) para cada fase estacionária separadamente, sendo que os parâmetros estatísticos obtidos foram de qualidade satisfatória. A polaridade das fases estacionárias indicada pela polaridade de McReynolds ( $P_R$ ), encontra-se refletida nos coeficientes das equações (a e b) obtidos para HP-1, HP-50, DB-210 e Innowax, os quais aumentam linearmente a medida que a polaridade também aumenta (intercepto). As análises estatísticas indicaram que os modelos de correlação quantitativa estrutura-retenção cromatográfica (QSRR) obtidos em fases estacionárias de baixa a média polaridade (HP-1 e HP-50) têm maior estabilidade e habilidade de predição do que os obtidos em fases estacionárias polares (DB-210 e Innowax). Sendo assim, pode-se concluir que, em fases estacionárias consideradas de baixa a média polaridade, o método semi-empírico topológico empregando somente um descritor obteve melhores resultados do que métodos que utilizaram descritores múltiplos.

The semi-empirical topological index, previously developed by Heinzen and Yunes, has been applied to predict the chromatographic retention of aliphatic ketones and aldehydes on stationary phases of different polarities (HP-1, HP-50, DB-210 and Innowax). Simple linear regressions between the retention indices and the semi-empirical topological indices (RI = a + bI $_{\rm ET}$ ) were established for each stationary phase separately, showing satisfactory statistical parameters. The polarity of the stationary phases, indicated by McReynolds polarity (P $_{\rm R}$ ), is reflected in the coefficients of the equations (a and b) obtained for HP-1, HP-50 and DB-210, which linearly vary as the polarity of the stationary phase increases (intercept). Statistical analyses showed that the quantitative structure-chromatographic retention relationship (QSRR) models obtained on stationary phases of low-to-medium polarity (HP-1 and HP-50) have higher stability and predictive ability than those on polar stationary phases (DB-210 and Innowax). Thus, it can be concluded that the semi-empirical topological method, using only one descriptor, yielded better results on low-to-medium polarity stationary phases than methods that used multiple descriptors.

Keywords: QSRR, topological descriptor, semi-empirical topological index, aldehydes, ketones

### Introduction

Correlations between gas chromatographic retention indices and molecular parameters provide significant information on the effect of molecular structure on retention time and possible mechanisms of absorption and elution. In recent years, our group has contributed with a number of quantitative structure-chromatographic retention relationship (QSRR) studies. 1-5 The influence of

the stationary phase polarity on the correlation and prediction of the retention of a variety of compounds by using different molecular descriptors has been the focus of several publications.<sup>6-20</sup>

The most recently published articles on QSRR are summarized as follows. Héberger and co-workers<sup>14-16</sup> applied different multivariate techniques (Principal Component Analysis - PCA, Cluster, Partial Least Squares Regression - PLS, Multiple Linear Regression - MLR) in order to establish correlations between Kováts retention indices and different molecular descriptors for 35 aliphatic

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ketones and aldehydes, on different stationary phases at four temperatures. From the results obtained, the following conclusions were drawn by the authors: (i) the retention behavior of ketones and aldehydes can not be completely distinguished from each other;<sup>14</sup> (ii) the models obtained using physico-chemical properties were slightly better than those obtained by MLR using chemical-quantum descriptors; (iii) the variables used in the last model suggested that the role of the steric factors must be more important for retention than the polar effects. <sup>16</sup> Guo et al. <sup>17</sup> employed the MLR and the artificial neural network (ANN) techniques to predict the chromatographic retention of saturated alcohols on stationary phases of different polarities using molecular topological indices. Good QSRR models were obtained to predict the retention index of 98 saturated esters on seven different polar stationary phases by MLR using the chemical descriptors proposed by Wang et al..18

The molecular interactions are complex and generally involve forces such as dispersion, orientation, induction, and electron donor-acceptor, including hydrogen-bonding forces.<sup>17,22,23</sup> The steric hindrance of substituent groups within the solute molecule can also affect the chromatographic behavior.<sup>23,24</sup> The dispersion forces have a predominant role in the interactions between non-polar molecules and non-polar stationary phases. Therefore, with polar molecules, such as aldehydes and ketones, the polar effects should be taken into account especially with polar stationary phases.

The contribution of the stationary phase to chromatographic retention should be reflected by the polarity, which is the most representative chromatographic property. Over the years, the system of stationary phase selectivity constants introduced by Rohrschneider and extended by McReynolds has become the most quoted and widely used indicator for evaluation of gas chromatographic polarity and selectivity. 11,25

We have recently developed a new topological index, called semi-empirical topological index ( $I_{\rm ET}$ ), based on new considerations on the chromatographic behavior of apolar and low-polarity stationary phases. This index was initially developed to predict the chromatographic retention for linear and branched alkanes and linear alkenes with the objective of differentiating their *cis*- and *trans*-isomers and to obtain QSRR models.<sup>3</sup> Subsequently, it was successfully extended to other classes of compounds.<sup>4,5</sup> The equation obtained to calculate  $I_{\rm ET}$  was generated using the molecular graph, the values attributed to the carbon atoms, and the functional group, observing the experimental chromatographic behavior, and further supported by theoretical considerations. The main advantage of the

use of the semi-empirical topological method is that it is able to differentiate isomeric compounds<sup>3,26,27</sup> and to predict chromatographic retention from simple linear regression using a single topological index.

The main goal of the present study is to verify the predictive ability of the semi-empirical topological index,  $I_{\rm ET}$ , on stationary phases having different polarities for ketones and aldehydes. A second goal is to use  $I_{\rm ET}$  in an attempt to obtain insights about the mechanism of chromatographic retention with more polar phases.

# **Experimental**

Calculation of semi-empirical topological indices

The generation of semi-empirical topological indices,  $I_{\rm ET}$ , for linear and branched ketones and aldehydes was described in a previous paper.<sup>4</sup> In the present approach, the molecules are represented by hydrogen-suppressed molecular graphs based on the chemical graph theory,<sup>28</sup> where the carbon atoms and the C=O groups (ketones and aldehydes) were considered as vertexes of the molecular graph of these compounds. The contribution coming from carbon atoms and from C=O groups to the chromatographic retention was represented by a single symbol,  $C_i$ , as may be observed from equation 1. Thus, the semi-empirical topological index ( $I_{\rm ET}$ ) is expressed as:

$$I_{ET} = \sum_{i} (C_i + \delta_i) \tag{1}$$

where  $C_i$  is the value attributed to C=O fragments and/or to each carbon atom i in the molecule; and  $\delta_i$  is the sum of the logarithm of the values of each adjacent carbon atom  $(C_1, C_2, C_3, \text{ and } C_4)$  and/or the logarithm of the value of the adjacent C=O group.

The values attributed to the carbon atoms and to the functional groups  $(C_i)$  for aldehydes and ketones were calculated by numerical approximation, based on experimental retention indices and supported by theoretical considerations (Table 1).<sup>4</sup>

Data set

The Kováts indices of aliphatic ketones and aldehydes were taken from the report by Hérberger and co-workers. <sup>16</sup> The experimental retention indices of 31 oxo compounds were measured on HP-1, HP-50, DB-210 and Innowax stationary phases at 50 °C. Ketones, aldehydes and their retention indices are shown in Table 2. The characteristics of stationary phases, as well as the polarity in terms of McReynolds constants, <sup>14,29</sup> are summarized in Table 3.

#### Regression analysis

The  $Origin^{@,30}$  and Bilin (a program developed by Kubiny)<sup>31</sup> computer programs were used in the regression analysis. To test the quality of the regression equations, the determination coefficient ( $r^2$ ), and the standard deviation (SD) were utilized as statistical parameters. The Bilin computer program was used to perform cross-validation tests ( $r^2_{CV}$ ) by the "leave-one-out" method <sup>32</sup> in order to verify the validity and stability of the QSRR models obtained.

#### **Results and Discussion**

The semi-empirical topological index  $(I_{\rm ET})$  was developed for a large set of organic compounds on low polarity stationary phases. For aldehydes and ketones, one of the most important aspects in chromatographic retention is the dispersion interaction between the surfaces of the solute and the stationary phase, which is related to steric factors and molecular size.

However, it is necessary to take into consideration the permanent dipole moment of the carbonyl group, which should provoke dipole-induced dipole interactions with any apolar stationary phase.<sup>4</sup> Obviously, the interactions

**Table 1.** Values of  $C_i$  attributed to the primary, secondary, tertiary and quaternary carbon atoms, in the  $\alpha$ ,  $\beta$ , and  $\gamma$  positions attached to the C=O group, and to the C=O group for aliphatic ketones and aldehydes  $(C_i)$ 

Fragment	Fragment position	$C_{i}$		
HC=O	aldehyde	2.094		
C=O	2	1.71		
C=O	3	1.69		
C=O	Middle of the chain <sup>a</sup>	1.60		
-CH <sub>3</sub>	-	1.00 <sup>b</sup>		
-CH,	-	$0.90^{\rm b}$		
>CH-	α	0.73		
>CH-	β	0.70		
>CH-	γ	0.765		
>C<	α	0.61		
>C<	β	0.61		

<sup>&</sup>lt;sup>a</sup> For compounds with more than 6 carbon atoms in the carbon chain; <sup>b</sup> reference 3.

**Table 2.** Values of experimental retention indices on HP-1 (RI<sub>HP-1</sub>), HP-50 (RI<sub>HP-50</sub>), DB-210 (RI<sub>DB-210</sub>), and Innowax (RI<sub>Innow</sub>), calculated retention indices (RI<sub>calc</sub>) and  $\Delta$ RI (= RI -RI<sub>calc</sub>) for each stationary phase, respectively, and calculated values of semi-empirical topological index (I<sub>ET</sub>) for ketones and aldehydes

No.	Compunds	RI <sub>HP-1</sub>	RI <sub>calc</sub>	$\Delta RI_{HP}$	RI <sub>HP-50</sub>	RI <sub>calc</sub>	$\Delta RI_{HP-50}$	RI <sub>DB-210</sub>	RI <sub>calc</sub>	$\Delta RI_{DB-210}$	RI <sub>Innow</sub>	RI <sub>calc</sub>	$\Delta RI_{Innow}$	$I_{_{\rm ET}}$
01	Acetone	469.7	469.4	0.3	606.3	598.6	7.7	792.2	755.8	36.4	835.0	800.1	34.9	4.1760
02	2-Butanone	574.7	569.5	5.2	711.6	697.9	13.7	882.1	857.1	25.0	919.8	891.8	28.0	4.9845
03	3-Me-2-butanone	639.9	632.8	7.1	767.1	760.7	6.4	943.3	921.1	22.2	949.4	949.8	-0.4	5.4960
04	3-Pentanone	675.4	665.9	9.5	808.8	793.5	15.3	960.8	954.6	6.2	996.9	980.0	16.9	5.7628
05	2-Pentanone	665.4	669.6	-4.2	799.3	797.2	2.1	973.9	958.3	15.6	996.2	983.5	12.7	5.793
06	2,2-Me-3-butanone	691.8	682.5	9.3	808	810.0	-2.0	992.0	971.4	20.6	968.5	995.3	-26.8	5.8971
07	4-Me-2-pentanone	720.1	722.5	-2.4	841.8	849.6	-7.8	1027.1	1011.8	15.3	1025.2	1031.9	-6.7	6.2198
08	3-Me-2-pentanone	733.5	732.9	0.6	859.6	860.0	-0.4	1036.1	1022.4	13.7	1033.9	1041.5	-7.6	6.3045
09	3-Hexanone	764.1	766.0	-1.9	893.6	892.8	0.8	1048.4	1055.8	-7.4	1068.0	1071.7	-3.7	6.5712
10	2-Hexanone	767.0	769.7	-2.7	901.3	896.5	4.8	1081.5	1059.6	21.9	1097.2	1075.1	22.1	6.6014
11	4-Heptanone	851.8	849.0	2.8	976.1	975.2	0.9	1134.5	1139.9	-5.4	1139.4	1147.8	-8.4	7.2421
12	5-Me-2-hexanone	835.4	836.5	-1.1	964.3	962.7	1.6	1161.3	1127.2	34.1	1156.1	1136.3	19.8	7.1407
13	3-Heptanone	864.9	866.1	-1.2	994.4	992.1	2.3	1153.6	1157.1	-3.5	1167.2	1163.4	3.8	7.3797
14	2-Heptanone	867.5	869.8	-2.3	1000.1	995.8	4.3	1184.3	1160.9	23.4	1195.8	1166.8	29.0	7.4099
15	2-Me-3-heptanone	917.5	929.4	-11.9	1031.9	1054.9	-23.0	1194.2	1221.2	-27.0	1178.7	1221.4	-42.7	7.8912
16	5-Me-3-heptanone	921.7	918.9	2.8	1041.5	1044.5	-3.0	1206.9	1210.6	-3.7	1200.1	1211.8	-11.7	7.8065
17	3-Octanone	964.8	968.0	-3.2	1094.9	1093.2	1.7	1255.5	1260.3	-4.8	1265.5	1256.8	8.7	8.2033
18	5-Nonanone	1051.4	1049.2	2.2	1175.4	1173.7	1.7	1342.6	1342.5	0.1	1334.1	1331.2	2.9	8.8591
19	Acetaldehyde	360.4	375.2	-14.8	487.9	505.2	-17.3	630.4	660.4	-30.0	715.8	713.7	2.1	3.4150
20	Propanal	472.7	475.3	-2.6	604.5	604.5	0.0	739.4	761.7	-22.3	808.8	805.4	3.4	4.2235
21	Isobutanal	540.3	538.6	1.7	660.5	667.3	-6.8	803.7	825.8	-22.1	830.4	863.5	-33.1	4.7350
22	Butanal	571.1	575.4	-4.3	702.5	703.8	-1.3	843.1	863.0	-19.9	894.8	897.1	-2.3	5.0320
23	Isovaleraldehyde	635.0	628.23	6.8	757.6	756.2	1.4	912.8	916.5	-3.7	936.0	945.5	-9.5	5.4588
24	2-Me-butanal	645.3	638.7	6.6	767.5	766.6	0.9	913.3	927.1	-13.8	931.2	955.2	-24.0	5.5435
25	Valeraldehyde	674.4	675.5	-1.1	807.4	803.0	4.4	953.8	964.3	-10.5	998.1	988.8	9.3	5.8404
26	3,3-Me-butanal	689.1	692.1	-3.0	803.7	819.5	-15.8	978.4	981.1	-2.7	968.6	1004.1	-35.5	5.9748
27	2-Ethyl-butanal	742.1	738.8	3.3	862.7	865.9	-3.2	1009.6	1028.4	-18.8	1018.0	1046.8	-28.8	6.3519
28	Hexanal	776.5	775.6	0.9	909.9	902.3	7.6	1059.3	1065.6	-6.3	1098.3	1080.5	17.8	6.6489
29	Heptanal	877.2	875.7	1.5	1009.8	1001.6	8.2	1162.7	1166.9	-4.2	1199.6	1172.2	27.4	7.4574
30	2-Ethyl-hexanal	933.2	939.0	-5.8	1049.3	1064.4	-15.1	1205.4	1231.0	-25.6	1197.8	1230.2	-32.4	7.9689
31	Octanal	977.8	975.8	2.0	1110.9	1100.9	10.0	1265.5	1268.2	-2.7	1298.8	1263.9	34.9	8.2659

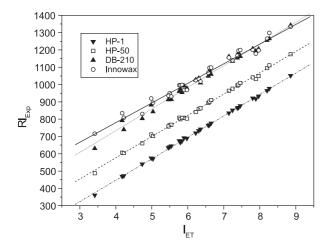
Table 3. Stationary phases and their McReynolds polarity

Number Notation		Stationary phase	McReynolds polarity a
01	HP-1	Dimethylpolysiloxane	222
02	HP-50	50% Phenylmethylpolysiloxane	884
03	J& W DB-210	50% Trifluoropropylmethylpolisiloxane	1520
04	HP- Innowax	Polyethylene glycol	2308

<sup>&</sup>lt;sup>a</sup> Sum of the first five McReynolds constants.<sup>29</sup>

between polar molecules and more polar stationary phases must be much stronger and more complex due to the high dipole moment of the molecules and possible hydrogenbonding interactions.

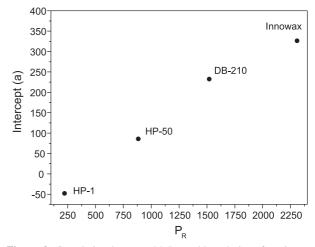
The simple linear correlation obtained between the experimental retention index and the semi-empirical topological index for each stationary phase is illustrated in Figure 1. The QSRR models (RI<sub>Exp</sub> =  $a + bI_{ET}$ ) of the corresponding graphs are summarized in Table 4. The "a" and "b" constants of the models obtained reflect the interactions between the molecule of the solute and the stationary liquid phase and are important in the prediction of the retention index. Since QSRR studies are generally carried out on non-polar stationary phases, it is important to observe how an increase in column polarity will affect the intermolecular interaction and alter the equation of



**Figure 1.** Simple linear regression between experimental retention indices ( $RI_{Exp}$ ) and semi-empirical topological indices ( $I_{ET}$ ) on stationary phases of different polarities (HP-1, HP-50, DB-210 and Innowax).

the QSRR model or its constants. As can be noted from Table 4, the "a" value changes according to the extent of interactions between the structure of the solute and the different molecules of stationary phase. Thus, as expected, the intercept values "a" increase with increasing the polarity of the stationary phase.

The correlation between the "a" coefficient and the McReynolds polarity ( $P_R$ ) indicates that HP-1, HP-50, DB-210 columns represent a different group of stationary phases from Innowax (Figure 2). The good linear correlation between coefficient "a" and  $P_R$  observed for all three polysiloxane phases (r = 0.9992; SD = 7.74) revealed the similarity between the structures of these phases, whereas for the Innowax (polyethylene glycol) phase a considerable deviation from this linearity can be seen from Figure 2. This analysis suggested a different mechanism



**Figure 2.** Correlation between McReynolds polarity of stationary phases  $(P_R)$  and the intercept (a) of QSRR models obtained using the semi-empirical topological index.

Table 4. Summary of the coefficients and statistical parameters for stationary phases of different polarity for  $RI_{Exp} = a + b I_{ET}$ 

Equation	Phase	P <sub>R</sub> <sup>a</sup>	a <sup>a</sup>	b <sup>a</sup>	$N^a$	r <sup>2 a</sup>	r <sup>2</sup> <sub>CV</sub> a	$SD^a$
1	HP-1	222	-47.5985	123.8071	31	0.999	0.999	5.47
2	HP-50	884	85.8069	122.8050	3 1	0.997	0.997	8.84
3	DB-210	1520	232.5661	125.2863	3 1	0.997	0.986	18.84
4	HP-Innowax	2308	326.4363	113.4154	31	0.979	0.976	22.30

 $<sup>^{</sup>a}$ a and  $^{b}$  = equation coefficients;  $^{N}$  = number of ketones and aldehydes;  $^{r}$  = determination coefficient;  $^{S}$  = standard deviation;  $^{r}$   $^{C}$  = cross-validated correlation coefficient;  $^{R}$  = McReynolds polarity.

of absorption and elution between the molecules of the solute and the last stationary phase. As observed by Zhang and Lu, <sup>13</sup> in stationary phases, which differ in structure, the molecular interactions would be different and consequently so would be the orientation of molecular interactions. This behavior was also observed in another paper, <sup>14</sup> where the authors used Principal Component Analysis- PCA to extract this information.

As expected, the retention indices of the compounds shifted to higher values as the polarity of the phase increased. Since  $I_{\rm ET}$  was developed in low polarity stationary phases, the standard deviation increased as the polarity increased (Table 4). This fact is in agreement with the enhanced role of specific molecular interactions on highly polar phases, as previously noticed by Héberger *et al.* <sup>15</sup>

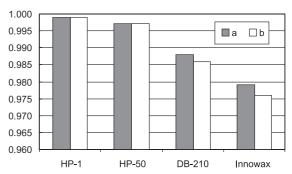
In multiple linear regressions, each coefficient describes the sensitivity of a property to each of the individual indices. Therefore, the coefficient of these parameters would measure the relative importance of each index.33 In simple linear regression, this kind of consideration is unnecessary. However, comparisons between coefficient "b" of the QSRR models generated (Table 4) can describe the sensitivity of retention indices with respect to I<sub>FT</sub> for each stationary phase with increasing polarity (HP-1< HP-50 < DB-210 < Innowax). The highest value of "b", the angular coefficient, observed in the QSRR models from Table 4, is provided by the DB-210 stationary phase, i.e., DB-210 is the most sensitive one. The most polar, Innowax is the least sensitive phase. Similar results were found analyzing the selectivities of these stationary phases. 14-16 According to the authors, such behavior was not surprising, since the DB-210 column is specially designed for separation of oxygenated compounds. The trifluoropropyl group has a high dipole moment, hence strong electron-acceptor capability, which results in an unusual retention order. In this column, carbonyl and nitro groups are more strongly retained compared to alcohols or esters, i.e., DB-210 has the unique property of retaining carbonyl groups more strongly than the hydroxyl group. 15 Thus, the most selective stationary phase recommended by these authors for the separation of oxo compounds is DB-210 and the least selective one is Innowax.

It is expected that factors related to polarity, such as dipole-dipole interactions or the protic nature of the compounds, have a great influence on the retention process in polar stationary phases. Therefore,  $I_{\rm ET}$  was not able to encode the degree of interaction of the molecules of solute with the molecules of the polar stationary phase, as well as with the molecules of less polar stationary phases. From Table 2, it can be noted that, for compounds such as 2-butanone, 3-pentanone, 2-pentanone, 2-hexanone, 2-

heptanone, hexanal, heptanal, and octanal (all linear compounds), the experimental retention indices (RI) are higher than the calculated values (RI<sub>Calc</sub>), showing a positive increase of  $\Delta RI$  values as the polarity of the stationary phase increases. This fact indicates a higher interaction of the carbonyl groups with polar stationary phases. On the order hand, observing the residual values ( $\Delta RI$ ) for most of branched molecules, which present branching near C=O moiety (2,2- dimethyl-3-butanone, 2-methyl-3-heptanone, 5-mehyl-3-hetanone, isobutanal, 2-methyl-butanal, 3,3-dimethyl butanal, 2-ethyl butanal and 2-ethyl-hexanal), a negative increase is showed as the polarity of the stationary phase increases. Obviously, branching prevents close contact with neighboring molecules in space by means of the steric effect. These results suggest that, the more polar is the stationary phase, the greater is the predominance of polar interactions with respect to the dispersion interactions on the retention of the compounds. For this reason, the steric effect on the polar moiety (C=O) of the molecule plays a more important role on polar stationary phases than on low polarity stationary phases.

The QSRR models individually generated for RI on four stationary phases of different polarities were validated by the cross validation using the leave-one method (Table 4). The statistical parameters (r and SD) of the models are also shown in Table 4. In general, the quality of the quantitative structure-property relationship (QSPR) models can be conveniently measured by the correlation coefficient (r) and the standard deviation (S.D). Mihalic and Trinajstic suggested that a good QSPR must have r > 0.995, and SD depends on the property studied. According to this statement, the models obtained on HP-1 and HP-50 represent an excellent QSRR model.

The cross-validated correlation coefficient  $(r^2_{CV})$  compared to the correlation coefficient  $(r^2)$  indicates the stability of the QSRR model. From Figure 3, it can be seen that the proposed model has higher statistical stability for HP-1 and HP-50 than for the more polar phases.



**Figure 3.** Determination coefficient,  $r^2$  (a), and cross-validated correlation coefficient,  $r^2_{CV}$  (b), for the calculated retention indices on stationary phases of different polarities using the semi-empirical topological index.

A graphical indication of the quality of QSRR models obtained on HP-1 and HP-50 columns can be seen in Figure 4. Figure 4a is a plot of calculated versus experimental retention index values for aliphatic ketones and aldehydes. The plot of the residuals versus calculated retention index values (Figure 4b) falls, as expected, within a horizontal band centered on zero.

Compared to the previously obtained structureretention models for the same set of 31 ketones and aldehydes using quantum-chemical and physico-chemical descriptors, the QSRR models reported in this paper are significantly better on HP-1 and HP-50 stationary phases, with a standard deviation 2.0 and 1.5 times smaller, respectively (Table 5). In this analysis, it is necessary to take into account that our models were generated using a single topological descriptor,  $I_{\rm ET}$ , while the other authors employed from 2 to 5 different descriptors.

Although correlations between  $I_{\rm ET}$  and the retention indices showed satisfactory statistical parameters, the SD values for DB-210 and Innowax stationary phases were higher than those obtained using physico-chemical and quantum-chemical descriptors, as illustrated in Table 5. It should be noted that  $I_{\rm ET}$  was not generated to reflect some specific interactions between polar molecules and polar stationary phases, as it was observed in this study.

Finally, it is interesting to point out that the correlations obtained in this study provided insights as to the mechanism of the retention process using merely one topological descriptor.

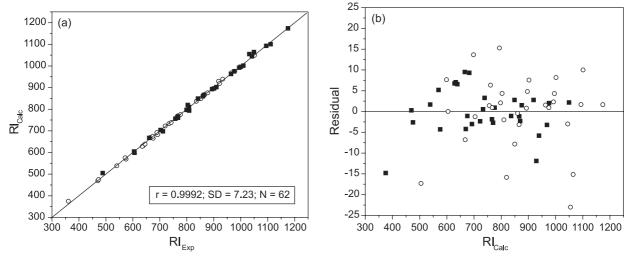


Figure 4. (a) Plot of the calculated vs. experimental retention index and (b) Plot of residual vs. calculated retention index of aliphatic ketones and aldehydes on HP-1( $\blacksquare$ ) and HP-50 ( $\bigcirc$ ) stationary phases.

Table 5. Comparison of statistical parameters for QSRR models obtained with physico-chemical descriptors, <sup>15</sup> quantum-chemical descriptors and the semi-empirical topological index  $(I_{pp})$ 

Stationary phase	Statistical characteristics	Quantum-chemical descriptors <sup>a</sup>	Physico-chemical descriptors <sup>b</sup>	Topological descriptor
HP-1	Descriptor	$S_{_{ m w}}$ and $\mu$	T <sub>BP</sub> ,M <sub>W</sub> , log P	$I_{\rm ET}$
	r	0.99787	0.9980	0.9995
	SD	10.93	10.93	5.47
	N	31	35	31
HP-50	Descriptor	$S_{w}, \mu, \alpha$	$\mathrm{T_{_{BP}}}$	$I_{ET}$
	r	0.9965	0.9970	0.9986
	SD	13.84	12.72	8.84
	N	31	35	31
DB-210	Descriptor	$S_{w}$ , $\mu$ , $E(LUMO)$ , $\alpha$ , $\beta$	T <sub>BP</sub> , log P	$I_{ET}$
	r	0.9980	0.9979	0.9939
	SD	10.69	11.23	18.84
	N	31	35	31
Innowax	Descriptor	$S_{_{w}}, \mu, \alpha, \beta$	$T_{_{\mathrm{BP}}},V_{_{\mathrm{m}}}$	$I_{ET}$
	r	0.9953	0.9930	0.9896
	SD	15.02	18.39	22.30
	N	31	35	31

<sup>&</sup>lt;sup>a</sup> Quantum-chemical descriptors:  $S_w$  = solvent accessible surface area,  $\mu$  = dipole moment, E(LUMO) = energy of the lowest unoccupied molecular orbitals,  $\alpha$  = isotropic average polarizability,  $\beta$  = average hyperpolarizability; <sup>b</sup> Physico-chemical descriptors:  $T_{BP}$  = boiling point,  $M_w$  = molecular mass, log P = octanal-water partition coefficient,  $V_m$  = molecular volume; <sup>c</sup> Topological descriptor:  $I_{ET}$  = semi-empirical topological index.

#### **Conclusions**

The present study demonstrated the successful application of semi-empirical topological indices to predict the chromatographic retention of aliphatic ketones and aldehydes on stationary phases of low-to-medium polarity.

Statistical analyses showed that the application of the QSRR model to HP-1 and HP-50 stationary phases has high internal stability, as established by cross-validation  $(r_{CV}^2)$ , and good predictive ability.

It should be pointed out that our topological index, using a simple linear regression, was able to encode structural features of the solute, and consequently to indicate which types of interactions are responsible for the retention of these compounds with the stationary phases studied.

Finally, the semi-empirical topological method, using only one topological descriptor, yielded better results on low-to-medium polarity stationary phases than methods that use multiple descriptors.

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