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# EVALUATION OF SUBSTITUENT CONTRIBUTIONS TO CHROMATO-GRAPHIC RETENTION: QUANTITATIVE STRUCTURE-RETENTION RE-LATIONSHIPS

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#### SUMMARY

The use of multiple regression analysis with the indicator variables in the statistical formulation of quantitative structure and retention relationships is demonstrated. Retention data of aromatic-aliphatic acids in paper chromatography and those of catecholamine derivatives in reversed-phase chromatography with octadecylsilica stationary phases and an aqueous eluent were analyzed. Statistical tests showed that the substituent parameters  $\Delta R_{M}$ , or the corresponding  $\tau$  values in column chromatography, can be estimated with high accuracy. Very good agreement was found between the observed and predicted  $R_{M}$  or  $\kappa$  values, the latter expressing the logarithm of retardation (capacity) factor. Data obtained with different octadecyl-silica stationary phases at various temperatures suggest that quantitative structure-retention relationships can be transformed from one reversed phase system to another as long as the eluent composition is the same.

INTRODUCTION

Martin<sup>1</sup> suggested first that a substituent changes the partition coefficient of a substance by a given factor that depends on the nature of the substituent and the two phases employed, but not on the rest of the molecule. Shortly thereafter, Bate-Smith and Westall<sup>2</sup> showed experimentally that a number of compounds follow Martin's extra-thermodynamic rule in paper chromatography. The observed substituent effect on retention is a manifestation of linear free energy relationships (LFER) that are widely used to interpret the effect of structural parameters on chemical rates and equilibria<sup>3</sup>. Since Lederer<sup>4</sup> gave the first account of the significance of LFER in chromatography, the evaluation and prediction of substituent contributions to chromatographic retention have been the subject of extensive study.

On the other hand, a similar approach to correlating molecular structure with biological activity has made substantial advances since Hansch<sup>s</sup> successfully applied LFER to the study of quantitative structure-activity relationships (QSAR). In order to quantify hydrophobic properties in QSAR water-octanol partition coefficients have most commonly been used, although Leo *et al.*<sup>6</sup> have demonstrated the collinearity of partition coefficients in different water-organic solvent systems in agreement with an earlier suggestion by Collander<sup>7</sup>.

In order to exploit the convenience offered by chromatographic techniques, attempts were made to obtain partition coefficients by using liquid-liquid chromatography. Moreover, chromatographic data have directly been used to establish QSAR<sup>8</sup>. High-performance liquid chromatography (HPLC) with bonded hydrocarbonaceous stationary phases has also been suggested as a method to evaluate partition coefficients<sup>9-12</sup>. Indeed, with the sophisticated instrumentation presently available, HPLC allows an easy and precise measurement of chromatographic retention under controlled conditions.

Reversed-phase chromatography with octadecyl-silica as the stationary phase is presently the most popular method in HPLC<sup>13</sup>. It has been shown that in this technique the retention behavior is governed by solvent effects which have a rigorous theoretical basis<sup>14-16</sup>. Advances in understanding the physico-chemical phenomena underlying the retention process in reversed-phase chromatography suggest that the technique may become a precise method for the convenient measurement of hydrophobic properties. Concomitantly, it is expected that the relationship between chemical structure and retention can be treated in a much more fundamental way than in other types of chromatography.

Quantitative structure-retention relationships (QSRR), however, can be generally established in most chromatographic systems on the basis of extra-thermodynamic LFER. The main reason for formulating QSRR in practice is that they can greatly facilitate the prediction of chromatographic retention from the molecular structure of the eluite. A large quantity of chromatographic data is readily processed by the computer, and advanced statistical methods, which have found application in QSAR studies, can be used for the establishment of QSRR.

In this paper, we present a general approach to the evaluation of substituent contributions to chromatographic retention by using multiple linear regression analysis and indicator variables. The application of the method is illustrated for reversed-phase chromatography of catecholamine derivatives with retardation (capacity) factors measured earlier<sup>17</sup> and recently in our laboratory. Retention data obtained by Kuchăr *et al.*<sup>18</sup> with aromatic–aliphatic acids in paper chromatography are also analyzed to establish QSRR. It is believed that the method can generally be used for formulation of QSRR and the prediction of retention values under given chromatographic conditions. It will be shown that there is a relationship between QSRR in slightly different reversed-phase chromatographic systems, and consequently retention values measured in one system can be used to predict the retention of chemically similar substances in another.

#### THEORETICAL

## Measures of retention and retention increments

Under ideal conditions, retention in liquid-liquid chromatography is directly related to the partition coefficient of the solute in the bulk eluent-liquid stationary phase system. In paper or thin-layer chromatography, the retention of a substance is measured by its  $R_F$  value. In order to use a thermodynamically more meaningful

retention parameter, Bate-Smith and Westall<sup>2</sup> introduced the term  $R_M$  given by

$$R_M = \log\left(\frac{1}{R_F} - 1\right) \tag{1}$$

For an "ideal" chromatographic system, the  $R_M$  value of a substance is linearly related to the logarithm of its partition coefficient, P:

$$R_{M} = \log P + \log C \tag{2}$$

where C is a constant for a particular system. In accordance with Martin's proposal<sup>1</sup>, the contribution of a given substituent to retention in paper and thin-layer chromatography is represented by the corresponding  $\Delta R_M$  value. With the octanol-water system, the chromatographically evaluated  $\Delta R_M$  is equivalent to the corresponding  $\pi$  value of the substituent<sup>5</sup>.

The retention in gas or liquid column chromatography is usually expressed in terms of the dimensionless retardation factor, k, which is defined by

$$k = (t_R - t_0)/t_0 \tag{3}$$

where  $t_R$  and  $t_0$  are the retention time of the substance under investigation and the hold-up time of an unretained tracer, respectively. The logarithm of the retardation factor, log k, has the same physico-chemical meaning as  $R_M$ ; both are proportional to the free energy change associated with the chromatographic distribution process<sup>14</sup>. For convenience and simplicity, we shall use the symbol  $\kappa$  for log k. The difference between the  $\kappa$  value of a substance *i*,  $\kappa_i$ , and that of its parent compound,  $\kappa_p$ , is denoted by log  $r_{i,p}$ , and is given by

$$\log r_{i,p} = \kappa_i - \kappa_p = \sum_{j=1}^m \tau_{ji}$$
(4)

where  $r_{i,p}$  is the corresponding relative retention and  $\tau_{jt}$  is a substituent parameter which measures the change in chromatographic retention upon replacing a hydrogen atom by substituent *j*. The maximum number of substituent parameters is *m* for the set of congeners.

It has been shown<sup>17</sup> that the  $\tau_{ji}$  values for a given substituent in a certain position are the same in different compounds *i*. Consequently, we can write  $\tau_j$  instead of  $\tau_{ji}$ . A given substituent in different positions, however, may have different  $\tau_j$  values, depending on the particular molecular environment which can change the effect of the substituent on retention, and therefore the number of  $\tau_j$  may be greater than the number of actual substituents.

#### Evaluation of quantitative structure-retention relationships

In analyzing solute retention in a given chromatographic system, the  $\kappa$  values of *n* congeners containing *m* possible substituents can be expressed by a set of linear equations:

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$$\kappa_{1} = \kappa_{p} + I_{11} \tau_{1} + I_{12} \tau_{2} + \dots + I_{1m} \tau_{m}$$

$$\kappa_{2} = \kappa_{p} + I_{21} \tau_{1} + I_{22} \tau_{2} + \dots + I_{2m} \tau_{m}$$

$$\vdots$$

$$\vdots$$

$$\kappa_{n} = \kappa_{p} + I_{n1} \tau_{1} + I_{n2} \tau_{2} + \dots + I_{nm} \tau_{m}$$
(5)

where the coefficient  $I_{ij}$  is the indicator variable, which is set to unity when a  $\tau_j$  value is assigned to a substituent in compound *i*, and to zero otherwise. Accordingly, for the parent compound, all indicator variables are zero and for the congeners only those which correspond to a position without substituent.

Eqn. 5 can be rewritten in matrix form and simplified as

$$[I_{ij}]_{n \times m} [\tau_j]_{m \times 1} + [\kappa_p]_{n \times 1} = [\kappa_i]_{n \times 1}$$
(6)

Eqns. 5 and 6 are also applicable to the analysis of retention data from paper or thinlayer chromatography, in which case  $\kappa$  and  $\tau$  are replaced by  $R_M$  and  $\Delta R_M$ , respectively.

Subtracting  $\kappa_p$  from each array of  $\kappa_1$  in eqn. 6, we obtain an expression containing the relative retention as

$$[I_{ij}]_{n \times m} [\tau_j]_{m \times 1} = [\kappa_i]_{n \times 1} - [\kappa_p]_{n \times 1} = [\log r_{i,p}]_{n \times 1}$$
(7)

If the number of substances is equal to the number of retention increments to be determined, the  $\tau_j$  values can be obtained by simple matrix operation. In practice, however, the number of congeners should exceed the number of  $\tau_j$  values in order to have a relatively large sample size for statistical evaluation. By using multiple regression analysis, the matrix  $\tau_j$  is solved so that the sum of squared deviations between the

regressed value log  $r_{i,p}$  and the observed log  $r_{i,p}$  is minimized. This is accomplished<sup>19</sup> when the derivative of the sum of squared derivations with respect to *m* unknown  $\tau_j$  values is zero, that is:

$$\frac{\partial}{\partial \tau_j} \sum_{i=1}^n (\widehat{\log r_i}_p - \log r_i_p)^2 = 0 \qquad j = 1, ..., m$$
(8)

This approach results in m linear equations which are solved to yield all unknown  $\tau_j$  values.

The statistical significance of the  $\tau_j$  values so obtained is tested by computing a measure of goodness-of-fit. The most useful test is the F test<sup>19</sup>, which is based on the calculation of the F ratio by

$$F_{m \ n-m} = \frac{n-m}{m} \cdot \frac{R^2}{1-R^2}$$
(9)

where R is the multiple correlation coefficient.

Comparison of the F ratio computed from eqn. 9 with values tabulated for the same degrees of freedom at a certain significance level yields the probability of the distribution tail. The lower is this probability, the more reliable are the  $\tau_1$  values.

#### EXPERIMENTAL

An Altex (Berkeley, Calif., U.S.A.) Model 100 HPLC solvent metering system with a Rheodyne (Berkeley, Calif., U.S.A.) Model 7010 sample valve and a Schoeffel (Westwood, N.J., U.S.A.) Model 770 variable-wavelength UV detector at 200 nm was used. Chromatograms were obtained with a Honeywell (Ft. Washington, Pa., U.S.A.) Model Electronik 194 recorder.

Both commercial and home-made columns were used. A Partisil-5 ODS column ( $25 \times 0.46$  cm) packed with irregularly shaped 5- $\mu$ m octadecyl-silica was obtained from Whatman (Clifton, N.J., U.S.A.). Bulk 5- $\mu$ m Spherisorb supplied by Phase-Sep (Hauppage, N.Y., U.S.A.) was treated with trichlorooctadecylsilane. The resulting spherical octadecyl-silica contained 11.8% of carbon and was packed by the balanced-slurry method into No. 316 stainless-steel tubing ( $15 \times 0.46$  cm).

The eluent was 0.1 *M* phosphate buffer, pH 2.1. The temperature of the Partisil ODS column was maintained at 333 K by circulating water through appropriate jacketing from a Model K2R-D (Messgeräte-Werk, Lauda, G.F.R.) constant-temperature bath. The flow-rate of eluent was 2 ml/min and the column inlet pressure was 21.4 MPa. Experiments with the Spherisorb ODS column were carried out at room temperature (296 K) at a flow-rate and inlet pressure of 0.5 ml/min and 2.41 MPa, respectively. The sample compounds were purchased from Aldrich (Milwaukee, Wisc., U.S.A.) or Sigma (St. Louis, Mo., U.S.A.). Retardation factors were evaluated from the chromatograms as customary by using sodium nitrate as the non-sorbed tracer.

Computations were carried out with the IBM 370/158 computer at Yale Computer Center.

#### **RESULTS AND DISCUSSION**

#### OSRR of aromatic-aliphatic acids in paper chromatography

Kuchăr et al.<sup>18</sup> have used paper chromatography to investigate  $R_M$  values of a large number of aromatic-aliphatic acids. In order to illustrate the present approach to QSRR in paper chromatography, we used their data to evaluate substituent contributions. The  $R_F$  values of three groups of compounds derived from phenylacetic acid, cinnamic acid and  $\alpha$ -methylcinnamic acid, which were measured in two paper chromatographic systems, were chosen because of the relatively large data base. The substances under investigation and their  $R_M$  values are listed in Table I.

In the first chromatographic system, denoted by A1, the retention values of two groups of congeners derived from phenylacetic and cinnamic acid were measured. Accordingly, two sets of linear equations such as eqn. 5 were formulated, one for the 16 phenylacetic acid derivatives and another for the 20 cinnamic acid derivatives. These two sets of equations, however, were put together and solved simultaneously as the substituent contributions are expected to be the same for similar compounds in a given chromatographic system. The  $\Delta R_M$  values thus evaluated for pertinent substituents are shown together with the statistics of the regression analysis in Table II.

The  $R_M$  values predicted on the basis of the statistically evaluated  $\Delta R_M$  values are consistent with the observed data as seen in Table I with the exception of the dialkoxy derivatives, compounds 36, 37, 67 and 68, whose irregular behavior was also observed by Kuchar *et al.*<sup>18</sup>.

#### TABLE I

# $R_M$ VALUES OBSERVED WITH AROMATIC-ALIPHATIC ACIDS BY KUCHAR *et al.*<sup>18</sup> IN PAPER CHROMATOGRAPHY AND THE VALUES PREDICTED FROM THE PRESENT QSRR

In chromatographic system A1 Whatman No. 4 paper was impregnated with 40% formamide in ethanol containing 5% formic acid and benzene-cyclohexane (1:1) was used as the mobile phase. In system B4 the paper was impregnated with 40% formamide in ethanol containing 5% of ammonium formate and the mobile phase was benzene-cyclohexane (7:3). The numbering of compounds is the same as used by Kuchar *et al.*<sup>18</sup>.

System A1				System	B4		
Compo	ound	R <sub>M</sub>		Compo	und	R <sub>M</sub>	
No.	Substituent	Observed	Predicted	No.	Substituent	Observed	Predicted
Phenyl	lacetic acid derivatives			Phenyl	acetic acid derivatives		
1	Н.	1.06	1.060	1	н	1.28	1.280
2	3-Cl	0.72	0.848	2	3-Cl	1.12	1.040
3	4-C!	0.72	0.735	3	4-Cl	1.00	1.000
4	4-tertC,H9	0.27	-0.140	4	4-tertC4H9	-0.05	-0.045
5	4-iso-C <sub>4</sub> H <sub>9</sub>	-0.37	-0.265	5	4-iso-C₄Hç	0.21	-0.230
6	4-iso-C <sub>3</sub> H <sub>7</sub>	0.05	0.050	6	4- <i>iso</i> -C <sub>3</sub> H <sub>7</sub>	0.14	0.145
7	$4-C_2H_5$	0.37	0.370	7	4-C₂H₅	0.50	0.500
8	4-CH <sub>3</sub> O	1.19	1.258	8	4-CH3O	1.19	1.173
9	4-n-C <sub>6</sub> H <sub>13</sub> O	-0.87	-0.670	9	4- <i>n</i> -C <sub>6</sub> H <sub>13</sub> O	-0.83	-0.856
10	4-iso-C4H9O	-0.03	-0.007	10	4- <i>iso</i> -C₄H₀O	0.05	-0.070
11	4-iso-C <sub>3</sub> H <sub>7</sub> O	0.37	0.353	11	4-iso-C₃H₂O	0.48	0.456
12	3-Cl,4-n-C <sub>6</sub> H <sub>13</sub> O	-1.12	-0.881	12	3-Cl,4- <i>n</i> -C <sub>6</sub> H <sub>13</sub> O	-1.12	-1.094
13	3-Cl,4-iso-C+H9O	-0.31	-0.220	13	3-Cl,4- <i>iso</i> -C <sub>4</sub> H <sub>3</sub> O	-0.33	-0.310
14	3-Cl,4-iso-C3H7O	0.21	0.142	14	3-Cl,4- <i>iso</i> -C <sub>3</sub> H <sub>7</sub> O	0.21	0.218
15	3-Cl,4-n-C <sub>3</sub> H <sub>7</sub> O	0.08	0.080	15	3-Cl,4- <i>n</i> -C <sub>3</sub> H <sub>7</sub> O	0.12	0.120
16	3-Cl,4-CH <sub>3</sub> O	0.95	1.046	16	3-Cl,4-CH <sub>3</sub> O	0.91	0.934
Cinnar	nic acid derivatives			a-Meth	ylcinnamic acid derivati	ives	
17	н	0.91	0.910	55	н	0.41	0.410
18	3-Cl	0.60	0.698	56	3-Cl	0.0*	0.171
19	4-Cl	0.60	0.585	57	3-Br	-0.14	0.140
20	3-Br	0.35	0.350	58	4-Br	-0.09	-0.090
21	4-1ertC₄H9	-0.16	0.290	59	4-NO2	1.00	1.000
22	4-iso-C4H9	0.31	-0.415	60	4-tertC4H9	-0.91	-0.915
23	4-iso-C3H7	-0.10	-0.100	61	4-iso-C₄H,	-1.12	1.100
24	4-n-C <sub>6</sub> H <sub>13</sub> O	-0.66	-0.819	62	4- <i>iso</i> -C <sub>3</sub> H <sub>1</sub>	-0.72	-0.725
25	4-cyclo-C <sub>6</sub> H <sub>11</sub> O	-0.50	0.500	63	4-iso-C <sub>3</sub> H <sub>7</sub> O	-0.43	-0.414
26	4-iso-C <sub>4</sub> H <sub>9</sub> O	-0.18	-0.160	64	$4-CH_2 = CHCH_2O$	-0.21	-0.210
27	4- <i>iso</i> -C <sub>3</sub> H <sub>7</sub> O	0.16	0.203	65	3-CH <sub>3</sub> O	0.23	0.230
28	$4-CH_2 = CHCH_2O$	0.55	0.596	66	4-CH₃O	0.31	0.303
30	3-Cl,4-n-C6H13O	-0.75	-1.030	67	3-CH <sub>3</sub> O,4- <i>n</i> -C <sub>6</sub> H <sub>15</sub> O	-1.12*	-1.906
31	3-Cl,4-iso-C4H9O	-0.23	-0.368	68	3-CH <sub>3</sub> O,4-iso-C <sub>3</sub> H <sub>7</sub> O	-0.02*	-0.594
32	3-Cl,4-iso-C3H7O	-0.05	-0.010				
33	$3-Cl, 4-CH_2 = CHCH_2O$	0.43	0.384				
34	3-Cl,4-C2H3O	0.60	0.600				
35	3-CI,4-CH <sub>3</sub> O	1.06	0.900				
36	3-CH <sub>3</sub> O,4-n-C <sub>6</sub> H <sub>13</sub> O	-0.14*	-0.319				
37	3-CH <sub>3</sub> O,4-iso-C <sub>3</sub> H <sub>7</sub> O	0.63*	0.703				

\* Not included in regression analysis.

Substituent	$\Delta R_{M}$	· •	
	System Al	System B4	
3-Cl	-0.211	-0.239	
4-Cl	-0.325	-0.280	
3-Br	0.560	-0.550	
4-Br		-0.500	
4-NO <sub>2</sub>		0.590	
4-tertC₄H9	-1.200	-1.325	
4-iso-C4H9	-1.325	-1.510	
4-iso-C3H7	-1.010	-1.135	
4-C₂H₅	0.690	-0.780	
4-C <sub>2</sub> H <sub>5</sub> O	0.099	_	
3-CH <sub>3</sub> O	_	-0.180	
4-CH <sub>3</sub> O	0.198	-0.107	
4-n-C <sub>6</sub> H <sub>13</sub> O	-1.729	-2.136	
4-cyclo-C₅H <sub>11</sub> O	-1.410	<del></del>	
4-iso-C4H9O	-1.067	-1.351	
4-iso-C <sub>3</sub> H <sub>7</sub> O	-0.707	-0.824	
4-n-C3H7O	-0.769	-0.922	
4-CH <sub>2</sub> =CHCH <sub>2</sub> O	0.314	-0.620	
Sample size (n)	34	27	
Multiple correlation (R)	0.995	0.999	
Standard error (s)	0.139	0.032	
F test (F)	120.1	1938.6	
Probability [P(tail)]	0.000	0.000	

#### TABLE II

 $\Delta R_{M}$  VALUES FOR SUBSTITUENTS IN PAPER CHROMATOGRAPHY

# QSRR of catecholamine derivatives in reversed-phase chromatography on octadecylsilica with an aqueous eluent

The retention behavior of the aromatic amines, acids and amino acids, the general structures of which are shown in Fig. 1, has been investigated. Their substituents and retardation factors are listed in Tables III and IV. The retardation factors were measured in two reversed-phase systems as described under Experimental and compared with those given by Molnár and Horváth<sup>17</sup>. In all of these studies aqueous 0.1 M phosphate buffer (pH 2.1) was used as the eluent. The main differences between the chromatographic systems arose from the siliceous supports used for the preparation of the octadecyl-silica column material and the operating temperature.

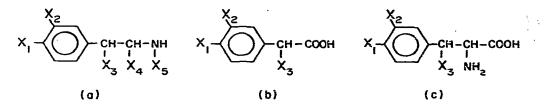


Fig. 1. General structures of the three groups of compounds investigated: (a) amines; (b) acids; (c) amino acids.

RETARDATION FACTORS OF The general structures and the po		AROMA <sup>7</sup> tions of th	<b>FIC AM</b> re substit	INES M tuents an	EASUREL e shown in	Fig. 1	H PAF a. The	RTISI inter	L OD	S AN on of	D SP the i	HERI ndicat	SORI or var	3 OD: riable	AROMATIC AMINES MEASURED WITH PARTISIL ODS AND SPHERISORB ODS COLUMNS sitions of the substituents are shown in Fig. 1a. The interpretation of the indicator variables is given in the text.	VS the text.
Compound	Substl	tuent				Indi	cator 1	Indicator variable	e						Retardatio	Retardation factor, k
	'X	<i>K</i> <sup>2</sup>	$X_3$	¥	Xs	lπ	<i>l</i> <sub>ii</sub>	I <sub>I</sub> ,	I.4	lis	li6	In I	lis	<i>I</i> 19	Partisil ODS (333 K)	Spherisorh ODS (296 K)
Norepinephrine	НО	HO	HO	H	H	-	0	0	1	0	-	0	0	0		0.01
Octopamine	НО	H	HO	Η	Η	-	0	0	0	0	_	0	0	0	0.22	0.058
Epinephrine	HO	HO	HO	H	CH,	-	0	0	-	0	-	0	0	-	0.26	0.068
Normetanephrine	HO	OCH,	HO	Н	H		0	0	0	l	-	0	0	•	0.50	0.12
Syncphrine	HO	H	НО	CH3	Н	-	0	0	0	0	_	0		0	0.50	0.12
Dopamine	НО	HO	Н	H	Η	-	0	0	-	0	0	0	0	0	0.58	0.18
Metanephrine	HO	OCH,	HO	Η	CH,	-	0	0	0		-	0	0		1.04	0.30
Tyramine	HO	H	Η	Η	Н	-	0	0	0	0	0	0	0	0	0.99	0.40
Phenylethanolamine	Н	H	HO	Н	Н	0	0	0	0	0	-	0	0	0	1.31	0.42
3-O-Methyldopamine	но	0CH <sub>3</sub>	Н	Η	Н	Ţ	0	0	0	-	0	0	0	•	2.20	0.91
Phenylethylamine <sup>*</sup>	Н	Н	H	Н	Н	0	0	0	0	0	0	0	0	•	3.16	1.10
Ephedrine	H	Η	НО	сH	СН	0	0	0	0	•	÷	0	-	-	5.22	2.07
* Parent compound of amin	of amines.										:					a state of the sta

TABLE III

\* Parent compound of amines.

# QUANTITATIVE STRUCTURE-RETENTION RELATIONSHIPS

$X_1$ $X_3$ $X_4$ $X_5$ $I_{11}$ $I_{13}$ $I_{13}$ $I_{13}$ $I_{13}$ $I_{14}$ $I_{13}$ $I_{14}$ $OH$	Dihydroxymandelic acid <i>p</i> -Hydroxymandelic acid <i>m</i> -Hydroxymandelic acid Vanilmandelic acid Dihydroxymbrovic acid				)(c			Retardath	Retardation factor, k
Dihydroxymandelic acidOH<	Dihydroxymandelic acid <i>p</i> -Hydroxymandelic acid <i>m</i> -Hydroxymandelic acid Vanilmandelic acid Dihydroxymbrovic acid			la			In .	Partisil ODS	Spherisorb ODS
p-Hydroxymandelic acidOHHOH010 $m$ -Hydroxymandelic acidHOHOHOH01001 $m$ -Hydroxymandelic acidOHOHOHOHOH01001 $n$ -Hydroxyphenylacetic acidOHOHOHOHOH010001 $n$ -Hydroxyphenylacetic acidOHHHH0100001 $p$ -Hydroxyphenylacetic acidOHHHH0100001 $p$ -Hydroxyphenylacetic acidOHHHH0100000 $p$ -Hydroxyphenylacetic acidOHOHOHHH010000 $p$ -HydroxyphenylaenineOHOHOHHH000000 $p$ -HydroxyphenylaenineOHOHOHOH0000000 $p$ -HydroxyphenylaenineOHOHOHOH00000000 $p$ -HydroxyphenylaenineOHOHOHOH00000000 $p$ -HydroxyphenylaenineOHOHOHOH00000000 $p$ -HydroxyphenylaenineOHOH <td>7</td> <td>-</td> <td>HO</td> <td>0 1 0</td> <td>1</td> <td>0 0</td> <td>1</td> <td>0.47</td> <td>0.10</td>	7	-	HO	0 1 0	1	0 0	1	0.47	0.10
$\begin{array}{cccccccc} \label{eq:constraints} \label{eq:constraints} \end{tabular} tabular$	Į,		HO					0.90	0.21
Dihydroxyphenylacetic acidOHOHOHH0100Mandelle acidMHHOHOHHH0100P-Hydroxyphenylacetic acidHHHO1000000Phenylacetic acidOHHHH010000000Phenylacetic acidOHOHHH010000000Phenylacetic acidOHOHHH0000000000Phenylacetic acidOHOHHH0000000000Phenylacetic acidOHOHHH1000	Pi	. •	HO					2.1	0.48
Mandelic acid P-Hydroxyphenylacetic acid Homovanillic acid Homovanillic acid Phenylacetic acid Dihydroxyphenylatinino CH H H H H H H H H H H H H H	N	s ≧r∎s‴	H	0	- <b>-</b>	0	0	3.96	1.85
Proyonoxypinentylactic acid Homovanilic acid Phenylacetic acid Dihydroxyphenylserine OH H H H 0 0 0 0 0 0 0 0 0 Dihydroxyphenylalanino OH H H 1 0 0 1 0 0 0 0 0 Tyrosine Dhenolalactics OH OH H H H 0 0 0 0 0 0 0 0 0 0 0 0 0 0		·. · ·	Ho	- -	0.0	00	- c	4.26	1.67
Phenylacetic acid H H H H U U U U U U U U U U U U U U U		-	c =				0	15.50	10.62
Dihydroxyphenylserine OH OH OH I 0 0 1 0 0 1 0 0 1 0 0 1 0 0 1 0 0 1 0 0 1 0			I,		0	0	0	23.96	<b>19.81</b>
	Dihydroxyphenylscrine		HO	00			00	0.08	0.013
	Phenylsering		Ho		• •	) > 0	<b>,</b> 0	0.86	0.25
			× z	- 0	00	••	••	1.04	0.46 0.97

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Unlike before, in this instance the number of retention increments,  $\tau_j$ , is greater than that of the substituents. With the compounds under study, a minimum of three different substituents in five positions has to be considered. Because of the different molecular environments in different positions as well as the effect of other groups, e.g., an ionized amino group or phenolic hydroxyl group in the molecule, the retention behavior will be affected<sup>17</sup>. The number of retention increments can be conveniently determined by using multivariate statistical methods of data analysis, e.g., cluster analysis<sup>20</sup>. In a previous study on QSAR of quinazolines<sup>21</sup> the use of such a pre-processing analytical method has been found to simplify greatly the attainment of an adequate correlation equation.

#### TABLE V

RETENTION INCREMENTS,  $\tau_j$ , OF SUBSTITUENTS IN COMPOUNDS SHOWN IN FIG. 1

j	Substituent	τ		
		Partisil ODS	Spherisorb ODS	LiChrosorb ODS
1	$X_1 = OH^*$	-0.512	-0.489	-0.635
2	$X_1 = OH^{**}$	-0.537	0.676	0.803
3	$X_2 = OH, X_1 = H$	-0.331	-0.390	-0.522
4	$X_2 = OH, X_1 = OH$	-0.292	-0.424	-0.224
5	$X_2 = OCH_3$	0.311	0.324	0.284
6	$X_3 = OH^*$	-0.606	0.800	-0.586
7	$X_3 = OH^{**}$	-0.856	-1.209	-0.936
3	$X_4 = CH_3$	0.390	0.445	0.399
)	$X_3 = CH_3$	0.361	0.512	0.330

\* Ionized amino group in the molecule.

\*\* No ionized amino group in the molecule.

Considering the molecular structures and on the basis of earlier observations<sup>17</sup>, we find that nine retention increments,  $\tau_j$  (j=1, 2, ..., 9), which are shown in Table V, are required for an accurate correlation of the retention with chemical structure. The appropriate  $\tau_j$  are selected by setting the indicator variables to unity or zero as shown in Tables III and IV.  $I_{i_1}$  is unity for compound *i* having OH as substituent X<sub>1</sub> and an ionized amino group in the molecule; if there is no ionized amino group in the molecule, then  $I_{i_2}$  is unity. With an OH group as substituent X<sub>2</sub> and H or OH as substituent X<sub>1</sub>, the indicator variables  $I_{i_3}$  or  $I_{i_4}$  are unity, respectively.  $I_{i_5}$  is unity when a methoxy group is attached to the aromatic ring as X<sub>2</sub>. For compounds with an ionized amino group  $I_{i_7}$  is unity.  $I_{i_8}$  indicates the replacement of a hydrogen atom by a CH<sub>3</sub> group in substituent X<sub>4</sub>. When substituent X<sub>5</sub> is CH<sub>3</sub>,  $I_{i_9}$  is used. For the acids and amino acids  $I_{i_8}$  and  $I_{i_9}$  are zero, and, therefore, they are not shown in Table IV.

In the present analysis, phenylethylamine, phenylacetic acid and phenylalanine served as parent compounds for the amines, acids and amino acids, respectively. The  $\tau_j$  values are calculated by solving 26 non-homogeneous linear equations (cf., eqn. 5), each representing a substance. The results listed in Table V are statistically reliable, as shown by the data in Table VI.

The  $\tau_i$  values in Table V establish QSRR for the chromatographic systems. The

# TABLE VI

STATISTICS OF THE	COMPUTATION	OF T	VALUES	FOR	COMPOUNDS	LISTED	IN
TABLES III AND IV		-					

Statistical parameter	Column used to	obtain retardation facto	rs
	Partisil ODS	Spherisorb ODS	LiChrosorb ODS
Sample size (n)	26	26	26
Multiple correlation $(R)$	0,995	0.992	0.999
Standard error of estimation (s)	0.105	0.178	0.035
F <sub>9.17</sub> ratio	196	110	2323
Probability [P(tail)]	0.000	0.000	0.000

retardation factor of any congener can be predicted according to eqn. 4 as the sum of the pertinent  $\kappa_p$  and the  $\tau_1$  values representing the appropriate substituents.

Correspondence of QSRR obtained with slightly different chromatographic systems

According to Collander<sup>7</sup>, the logarithms of partition coefficients in systems containing water and different organic solvents are collinear. In reversed-phase chromatography the relationship between  $\kappa$  values obtained with different octadecyl-silica phases has not yet been investigated, although the observed collinearity between  $\kappa$  and log P values<sup>9-12</sup> would suggest a proportionality between corresponding  $\kappa$  values obtained with two columns by using the same type of hydrocarbonaceous bonded stationary phase.

In order to compare QSRR obtained with slightly different reversed-phase systems, in this study three sets of  $\kappa$  values were measured with different octadecyl-silica stationary phases and the same aqueous eluent at various column temperatures. The data are plotted in Fig. 2, which shows that the  $\kappa_1$  values are collinear. The correlation equations are as follows:

$$\kappa_i^{(2)} = -0.512 + 1.268 \kappa_i^{(1)}$$
 (10)

$$\kappa_i^{(3)} = 0.047 + 0.996 \,\kappa_i^{(1)} \tag{11}$$

where the superscripts (1), (2) and (3) denote data obtained with the Partisil ODS, Spherisorb ODS and LiChrosorb ODS columns, respectively.

The difference between the numerical coefficients in eqns. 10 and 11 can be explained by the temperature differences between the chromatographic systems investigated. From a study of enthalpy-entropy compensation observed in reversed-phase chromatography under similar conditions<sup>22</sup>, we can derive a relationship for the corresponding  $\kappa_i$  values measured with the same chromatographic system at two different temperatures,  $T^{(a)}$  and  $T^{(b)}$ , as follows:

$$\kappa_i^{(a)} = \left[ \left( \frac{\beta - T^{(a)}}{\beta - T^{(b)}} \right) \cdot \frac{T^{(b)}}{T^{(a)}} \right] \kappa_i^{(b)} + f(\Delta S)$$
(12)

÷ ...

where  $f(\Delta S)$  is a function of entropy and  $\beta$  is the compensation temperature, which can be taken as 600 K, the mean of the experimental values. The slopes for  $\kappa_i^{(2)} =$ 

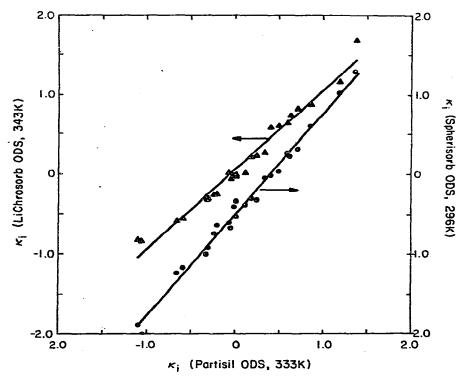


Fig. 2. Correlations between the logarithm of the retardation factors,  $\kappa_t$ , measured with the catecholamine derivatives with different octadecyl-silica columns at different temperatures. In each instance the eluent was 0.1 M phosphate buffer, pH 2.1.

 $f[\kappa_i^{(1)}]$  and  $\kappa_i^{(3)} = f[\kappa_i^{(1)}]$  according to eqn. 12 are 1.28 and 0.94, respectively. These values are commensurable with 1.268 and 0.996, which are the respective slopes in the correlation of  $\kappa_i$  data shown in eqns. 10 and 11.

The results strongly suggest that the variation between the three sets of  $\kappa$  values is essentially due to differences in column temperature and not to dissimilarities between the octadecyl-stationary phases. This finding is in agreement with the predictions of the solvophobic theory<sup>14</sup> for the case of invariant eluent composition. In contradistinction, the theory would not predict such a simple relationship between QSRR evaluated at different mobile phase compositions even by using the same column.

The  $\tau_j$  values calculated from the corresponding  $\kappa_i$  data obtained with the three different chromatographic systems have also shown satisfactory correlation according to the following equations:

$$\tau_i^{(2)} = -0.008 + 1.272 \,\tau_i^{(1)} \tag{13}$$

$$\tau_j^{(3)} = -0.050 + 1.084 \,\tau_j^{(1)} \tag{14}$$

In eqns. 13 and 14 the respective slopes are very similar to those in eqns. 10 and 11 and this finding, which is also evident from Fig. 3, suggests that the above equations allow

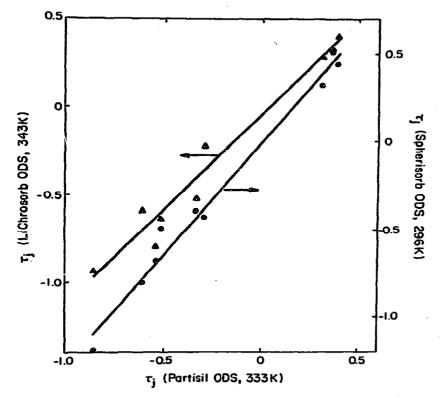


Fig. 3. Correlation between the substituent increments,  $\tau_j$ , evaluated from retention data measured with the same aqueous eluent on different octadecyl-silica columns.

the transfer of a set of retardation factors from one chromatographic system to another, and thus facilitate the prediction of  $\kappa$  values from structural parameters under different chromatographic conditions. Furthermore, the statistical method proposed here can serve as a diagnostic tool for the study of the different retention behaviors between various chromatographic systems.

An outstanding feature of HPLC is the facility of generating a large amount of precision data. Appropriate statistical methods can not only cope with the task of data analysis, but also augment the scope and potential of this powerful analytical technique.

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