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RETENTION INDEX-STRUCTURE RELATIONSHIPS FOR ALCOHOLS USING FACTOR ANALYSIS

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SUMMARY

The technique of factor analysis is applied to a data matrix composed of the retention indices of twenty-six saturated and unsaturated alcohols measured on twenty-five solvents. Five factors were found sufficient to span the data space of saturated alcohols, while six factors were required when unsaturated alcohols were included in the data matrix. Successful rotations were made into the following chemically and physically significant solute parameters: (1) unity, (2) molecular weight, (3) molar refraction, (4) carbon number, (5) boiling point (°K), (6) placement of hydroxyl group, (7) In vapor pressure and (8) molar heat of vaporization. Then, restricting the data matrix to saturated alcohols only, various combinations of five out of the eight identified parameters were used in an attempt to best span the space, the criteria of best fit being the mean error between experimental and predicted retention indices. Using the "best set", equations were developed which permitted the retention index of a new alcohol to be predicted on any of the twenty-five solvents, knowing only the five parameters of that solute. The resulting equations were successfully tested on four alcohol solutes which were not included in the original data matrix but for which experimental retention index data were available.

INTRODUCTION

Recently TAKACS *et al.*¹ showed that it is possible to relate the structure of saturated paraffins to their retention indices determined on squalane. This problem was amenable to solution because of the simplicity of the solutes and the use of only one stationary phase. In a more ambitious study, CASTELLO AND D'AMATO² have attempted to correlate the retention indices of the alkyl iodides with their molecular structures and physical properties. They correlated retention indices with boiling

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point, placement of the iodine atom on the chain, and molecular volume. Again, however, the correlations were obtained on only one stationary phase, tricresyl phosphate. In order to make these studies more general, one would like to correlate data of many solutes taken on a series of stationary phases ranging from nonpolar to highly polar. This more general problem has not been solved because of the lack of an adequate procedure for isolating the controlling factors operative in determining retention indices. For solutes more complex than the paraffins, there exist additional factors, each of which affect the observed retention index to a different extent. The magnitude of each subfactor should depend upon some property of the solute in question, as well as some property of the stationary phase being used. For example, in a series of alcohol solutes, one would expect the number of controlling solute factors to consist of the sum of those present for saturated paraffins of similar carbon chain structure plus additional factors attributable to the presence of the polar hydroxyl group in the solute. These additional factors would include at a minimum dipoledipole, dipole-induced dipole and hydrogen-bonding interactions. With such a multifactor problem, no method of attack has proven successful in isolating the individual factors.

Recently, the technique of factor analysis has been helpful in unraveling the number and nature of the controlling factors operative in several multi-dimensional problems³⁻⁰. Factor analysis has been applied to the problems of solvent effects in nuclear magnetic resonance³⁻⁰, activity coefficients determined at infinite dilution by gas chromatography⁷ and solute structure-retention index relationships^{8,9}. This technique can be utilized whenever the quantity being factor analyzed can be expressed as a linear sum of factors, each factor being a product function of solute and solvent parameters³. Recent work indicates that these two criteria are met by the retention index function.

Using the data of ROHRSCHNEIDER¹⁰ who reported retention indices of thirty nonpolar and polar solutes on twenty-three solvents, WEINER AND HOWERY^{8,9} applied the technique of factor analysis and found that eight factors were required to span the factor space such that all data were reproduced within a column average error of three retention index units or less. Several physically and chemically significant parameters were successfully associated with the abstract eigenvectors of the space. By a least squares rotational scheme, physically significant parameters such as gas phase fugacity⁸ and solute molar polarizations⁹ were identified with abstract eigenvectors of the space. Chemically significant parameters identified with abstract eigenvectors were solute hydrogen-bonding ability and electron-donor tendencies⁸. These conclusions may be quite general since a large number of functional groups for both solutes and solvents are represented in the data matrix of ROHRSCHNEIDER.

In the present study, the technique of factor analysis is applied to the problem of identifying the controlling factors which affect the retention indices of saturated and unsaturated alcohols in nonpolar and polar solvents. The data for this study was taken from the compilation of McReyNOLDS¹¹ who reported retention indices for many solutes on seventy-six solvents. Retention indices at 120°C of twenty-six saturated and unsaturated alcohols (solutes shown in Table I), taken on twenty-five solvents (solvents shown in Table II), were chosen for factor analysis. The other information shown in Tables I and II will be discussed later under the section entitled Uniqueness tests.

RESULTS

Number of fundamental factors

The problem was divided into two parts in order to ascertain if the introduction of unsaturation in the solute molecules affected the number of controlling factors. The data matrix for part one contained retention indices for saturated alcohols on all twenty-five stationary phases; the matrix for part two contained data for both saturated and unsaturated alcohols on all stationary phases. We found that five factors were sufficient to span the saturated-alcohol retention index space while six factors were required for the data matrix containing both saturated and unsaturated alcohols. These conclusions were based on observing the column average errors for the two problems as the number of abstract eigenvectors in the space was systematically increased, and were further substantiated when we tested physically and chemically significant parameters for possible identification with the abstract eigenvectors of both data matrices. The same fit for a given test factor was obtained with five factors in the saturated alcohol problem as with six factors in the problem containing the unsaturated alcohol data. In the remainder of this paper (except for the last section), all results are for the larger problem using six factors in the least squares rotation matrix.

TABLE I

| Solute | Uniquene | \$\$ | Additional values | | | | |
|------------------------|--------------|------|---|--|--|--|--|
| | Number Value | | ····· | | | | |
| Methanol | I | 0.76 | 2, 0.31 | | | | |
| Ethanol | 2 | 0.20 | 1, 0.31 | | | | |
| Propanol | 3 | 0.10 | 2, 0.10 | | | | |
| Isopropanol | 4 | 0.14 | 1, 0.13; 2, 0.14; 8, 0.16 | | | | |
| Butanol | 5 | 0.12 | 6, 0, 15; 9, 0, 12 | | | | |
| Isobutanol | ő | 0.24 | 5 and 9, 0.15 | | | | |
| secButanol | 7 | 0.11 | 8, 0.13 | | | | |
| tertButanol | 8 | 0.25 | 4, 0.16; 7, 0.13 | | | | |
| Pentanol | 9 | 0.14 | 5, 0.12; 6 and 13, 0.15; 21, 0.18 | | | | |
| 2-Pentanol | 10 | 0.05 | | | | | |
| 3-Pentanol | II | 0.09 | 17, 0.11 | | | | |
| 2-Methyl-2-butanol | 12 . | 0.14 | 8, 0.14; 16 and 18, 0.12 | | | | |
| Hexanol | 13 | 0.19 | 9, 0.15; 21, 0.28 | | | | |
| 2-Hexanol | 14 | 0.07 | 21, 0.12 | | | | |
| 3-Hexanol | 15 | 0.11 | 17, 0.12; 18, 0.11; 19, 0.13; 20, 0.14 | | | | |
| 2-Methyl-2-pentanol | 16 | 0.12 | 8 and 12, 0.12; 18, 0.10 | | | | |
| 3-Methyl-3-pentanol | 17 | 0.19 | 11 and 12 and 15 and 19, 0.12; 18, 0.17 | | | | |
| 2,3-Dimethyl-2-butanol | 18 | 0.15 | 12 and 20, 0.12; 17, 0.17 | | | | |
| 3-Heptanol | 19 | 0.19 | 15, 0.13; 17, 0.11; 20, 0.18 | | | | |
| 4-Heptanol | 20 | 0.19 | 15, 0.14; 19, 0.18; 21, 0.15 | | | | |
| Octanol | 21 | 0.46 | 13, 0.28; 19, 0.19 | | | | |
| Cyclopentanol | 22 | 0.43 | 23, 0.42 | | | | |
| Cyclohexanol | 23 | 0.45 | 22, 0.42 | | | | |
| 2-Propen-1-ol | 24 | 0.17 | 22, 0.10; 26, 0.08 | | | | |
| 2-Propyn-1-ol | 25 | 0.81 | 26, 0.19 | | | | |
| 1-Penten-3-ol | 26 | 0.10 | 24, 0.08; 25, 0.19 | | | | |

UNIQUENESS TESTS FOR SOLUTES

Uniqueness tests

Before proceeding to the testing of physically and chemically significant parameters, it is important to determine if any of the solutes or solvents in the scheme exhibit a uniqueness in properties not present in the other compounds in the scheme. This uniqueness test is accomplished by defining a test vector consisting of unity for the solute or solvent suspected of containing the unique factor and of zeros for all other points on the vector⁹. The results of the uniqueness tests for the solutes are shown in Table I, where each row of the table corresponds to a separate uniqueness test vector. The only solutes which seemed to be truly unique were 2-propyn-1-ol (the only solute containing a triple bond) and methanol. Other solutes which seemed to show some slight degree of uniqueness were cyclopentanol and cyclohexanol. For each cycloalcohol uniqueness test vector, the only other high value was for the other cycloalcohol. Another example of the correlation of high values on a given uniqueness test involves the two double bond-containing solutes, 2-propen-I-ol and I-penten-3-ol. The two double bond-containing alcohols share a common unique property not only with each other, but also with the triple-bonded solute, 2-propyn-I-ol, and interestingly with cyclopentanol.

We can also test for unique properties among the stationary-phase solvents with the uniqueness test vector by using the transposed data matrix⁹. The results are shown in Table II. The sole solvent exhibiting quite unique properties was diglycerol, the only hydroxyl-rich solvent.

TABLE II

UNIQUENESS TESTS FOR SOLVENTS

| Solvent | Uniqueness | | Additional values |
|------------------------------|------------|-------|--|
| | Letter | Value | - |
| Apiczon L | A | 0.32 | P. 9.20; R. 9.16; S. 9.21; T. 9.17 |
| Carbowax 600 | в | 0.26 | C. 0.22: M. 0.16: 0. 0.15 |
| Carbowax 20M | C | 0.29 | B and o. 0.22: M. 0.20 |
| Dibutyl tetrachlorophthalate | Ď | 0.10 | |
| Di-2-ethylhexyl sebacate | Ē | 0.12 | H. 0.12: N and U. 0.13: X. 0.15 |
| Diglycerol | F | 0.93 | X. 0.15 |
| Diisodecyl phthalate | Ğ | 0.06 | ,, |
| Dioctvl sebacate | H | 0.13 | N and U. 0.13; X. 0.16 |
| Dow Corning 550 fluid | I | 0.13 | A. 0.15: J. 0.13: P. 0.20 |
| Dow Corning FS 1265 fluid | Ī | 0.31 | L. 0.26: O. 0.18 |
| Flexol 8N8 | ĸ | 0.18 | $P_{.} - 0.20$; X. 0.13 |
| Hyprose SP-80 | L | 0.47 | I. 0.26: O. 0.30 |
| IGÉPAL CO 880 | М | 0.15 | B. 0.16; C. 0.20; O. 0.17 |
| Isooctvldecvl adipate | N | 0.13 | E and H and N and U. 0.13; X. 0.16 |
| Pluronic F77 | 0 | 0.19 | B. 0.15; C. 0.22; M. 0.17 |
| Polyphenvl ether-5 rings | Р | 0.56 | A and I. 0.20: K. -0.20 : O. -0.22 |
| Ouadrol | 0 | 0.44 | I. 0.17: L. 0.30: P0.22 |
| SE-30 | Ř | 0.13 | A. 0.16: S. 0.17: T. 0.13 |
| SE-31 | S | 0.23 | A. 0.21; R. 0.17; T. 0.16 |
| SE-52 | Т | 0.13 | A. 0.17; R. 0.13; S. 0.16 |
| Sucrose acetate isobutvrate | Ũ | 0.17 | B and E and H and N. 0.13: X. 0.14 |
| TMP Tripelargonate | v | 0.00 | E and N and X. o. to: U. o. tt |
| Tricresvl phosphate | W | 0.05 | |
| Ucon LB-1715 | x | 0.10 | C. 0.10; O. 0.11; O. 0.12 |
| Zonyl E-7 | Y | 0.30 | E and F, 0.15; H and N, 0.16; U, 0.14 |

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Tests of physically and chemically significant parameters

Before evaluating the fit for a given test factor, one should take into consideration the results of the uniqueness tests, because a high uniqueness value could be caused by errors in the data. If this is the case, then forcing a test vector through this solute or solvent point could cause the entire test vector to be in error. If true uniqueness exists, one must also be cautious in assigning values for that point in any test vector. With the factor analysis scheme in its most sophisticated form, the values for all the points on a suspected vector are not required to test a property by the least square part of the computer program³. If all defined points on the test vector rotate into nearly equivalent values on an abstract eigenvector, then it is legitimate to assume that the rotation is successful. If the rotation is acceptable, then values will be generated for those points left "free floating" on the test vector. The capability for "free floating" some test points has proven quite helpful in our previous testing of solute and solvent properties in gas chromatography^{8,0}. The results of testing various chemical and physical properties of the alcohols for possible identification with the abstract eigenvectors of the space are given below.

Unity. To test if there is a common factor present in all of the solutes, a test vector composed entirely of ones is created. The results of this test are shown in Table III. The agreement is quite excellent, indicating that for an all-alcohol problem, all solutes share a common factor or factors (as expected for an all-alcohol problem).

Carbon number. The basis of the retention index system is the concept of a carbon number. For the *n*-alkanes, the retention index is defined as one hundred times the number of carbon atoms in the molecule, so that the difference in retention \cdot index for each consecutive member of the homologous series is set equal to one hundred retention index units. For any series of compounds containing a common functional group, the retention indices can also be reported relative to the normal straight chain members of that series. One major question amenable to attack by factor analysis is the effects on the carbon number of moving the functional group from the primary position on the solute chain. Since secondary retention indices have been shown to yield consistent results previously, we can define a carbon number test vector such that all *n*-alcohols are assigned a carbon number equal to the number of carbon atoms present in the alcohol, and all other points are "free floated".

The results of this test are shown in Table III. The agreement between the suspected values and the rotated values is excellent. The other predicted values on this vector should then indicate the effects of isomerism on carbon number. These effects seem to depend systematically upon the structure of the alcohols. From a study of the predicted carbon numbers in Table III, the following effects of isomerism on the carbon number can be estimated:

(i) A hydroxyl group in a secondary position causes approximately 0.2 carbon number to be subtracted from the carbon number of the corresponding primary alcohol.

(ii) A hydroxyl group in a tertiary position causes approximately 0.4 carbon number to be subtracted from the carbon number of the corresponding primary alcohol.

(iii) Cyclizing an alcohol causes approximately 0.7 carbon number to be subtracted from the corresponding straight chain alcohol value. We make the following

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TABLE III

TESTS FOR CHEMICAL AND PHYSICAL PARAMETERS OF SOLUTES⁴ Values in parenthesis "free floated" in test vectors.

| Solute | Unity | | Carbon number | | Substituent effect | | Molar heat of vaporization ^a | |
|------------------------|-------|-----------|---------------|-----------|--------------------|-----------|--|-----------|
| | Test | Predicted | Test | Predicted | Test | Predicted | Test | Predicted |
| Methanol | I | 0.98 | I | 1.00 | (o) | 0,01 | 9.11 | 9.03 |
| Ethanol | I | 1.01 | 2 | 2,00 | ī | 1,00 | 9.41 | 9.55 |
| Propanol | I | 0.99 | 3 | 2.99 | I | 0.99 | 9.88 | 9.71 |
| Isopropanol | I | 1.02 | U | 2.84 | (2) | 1.90 | 9.58 | 9.53 |
| Butanol | I | 0.99 | 4 | 4.01 | Ì | 1.02 | 10.47 | 10.42 |
| Isobutanol | I | 0.94 | • | 4.06 | | 0.97 | 10.24 | 10.14 |
| secButanol | r | 1.00 | | 3.83 | (2) | 2.03 | 9.93 | 9.59 |
| tertButanol | I | 1.05 | | 3.70 | 3 | 3.00 | 9.67 | 9.84 |
| Pentanol | I | 1.00 | 5 | 4.99 | Ĩ | 1.00 | 10.60 | 11.03 |
| 2-Pentanol | I | 0.99 | 0 | 4.74 | (2) | 1.96 | | 9.8ĭ |
| 3-Pentanol | I | 0.97 | | 4.80 | (2) | 2.03 | | 9.04 |
| 2-Methyl-2-butanol | I | 1.03 | | 4.64 | 3 | 3.00 | 9.33 | 9.41 |
| Hexanol | I | 1.00 | 6 | 6.00 | I | 0.98 | | 11.44 |
| 2-Hexanol | I | I.OI | | 5.80 | (2) | 2.08 | | 10.52 |
| 3-Hexanol | I | 0.98 | | 5.82 | (2) | 2.15 | | 9.62 |
| 2-Methyl-2-pentanol | Ĩ | 1.01 | | 5.53 | ั้้รั | 2.99 | | 9.80 |
| 3-Methyl-3-pentanol | I | 1.00 | | 5.59 | 3 | 2.98 | | 9.17 |
| 2.3-Dimethyl-2-butanol | I | · 1.00 | | 5.49 | 3 | 3.03 | | 9.30 |
| 3-Heptanol | I | 1,00 | | 6.89 | (2) | 2.26 | | 10.39 |
| 4-Heptanol | I | 0.99 | | 6.81 | (2) | 2.34 | | 10.11 |
| Octanol | I | 1.03 | 8 | 8.00 | ľ | 1.01 | 12.70 | 12.56 |
| Cvclopentanol | I | 0.99 | | 4.26 | | 0.67 | • | 9.77 |
| Cyclohexanol | I | 1.04 | | 5.20 | | 1.15 | 10.84 | 10.88 |
| 2-Propen-1-ol | I | o.gg | | 2.71 | | 0.10 | • | 9.23 |
| 2-Propyn-1-ol | I | 1.04 | | 2.57 | | -2.06 | 9.1.1 | 9.19 |
| 1-Penten-3-ol | I | 0.95 | | 4.42 | | 1.13 | - 1 | 8.95 |

very tentative statements concerning the effects of unsaturation on the carbon number.

(iv) A double bond (based on the predicted value for 2-propen-1-ol) reduces approximately 0.3 carbon number from the *n*-alcohol value.

(v) A triple bond (based on the predicted value for 2-propyn-I-ol) reduces approximately 0.4 carbon number from the *n*-alcohol value. The effects of isomerism and unsaturation may be additive since the carbon number predicted for I-penten-3-ol (4.42) approximates the carbon number calculated using effects (i) and (iv) (*i.e.*, 5.0 - 0.2 - 0.3).

Substituent effects. A test vector can be defined which relates one of the solute factors of the space to the number and type of substituents on the carbon atom containing the hydroxyl group. As a first approximation to this vector, we specify the number of carbon atoms directly attached to the carbon containing the hydroxyl group. On this substituent test vector, the primary alcohols are assigned a value of one and the tertiary carbons a value of three. As a check of the validity of the test vector, methanol and all secondary alcohols are "free floated". If the test vector is

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| 7 ap or pressure ^a In vapor pressu | | bor pressure | Molar refraction ^a | | Molecular weight | | Boiling point ^b | | |
|--|-----------|--------------|-------------------------------|--------|------------------|---------|----------------------------|-------|-----------|
| Fest | Predicted | Test | Predicted | Test | Predicted | Test | Predicted | Test | Predicted |
| 5090 | 5006 | 8.535 | 8.312 | 8.2 | 7.9 | 32.0 | 31.0 | 337.9 | 333.2 |
| 320 | 3434 | 8.107 | 8:365 | 12.8 | 13.1 | 46.1 | 47.9 | 351.6 | 353.5 |
| 730 | 1794 | 7.455 | 7.647 | 17.4 | 17.9 | 60.1 | 61.6 | 370.4 | 368.9 |
| 000 | 2835 | 8.006 | 8.142 | 17.5 | 17.5 | 60,1 | 60.0 | 355.6 | 358.8 |
| 853 | 1142 | 6.748 | 6.823 | 22.I | 22.3 | 74. I | 75.3 | 391.2 | 391.4 |
| 070 | 663 | 6.975 | 6.651 | 22.2 | 22.2 | 74.1 | 73.4 | 381.3 | 373.8 |
| 660 | 1387 | 7.414 | 7.400 | 22.2 | 22.4 | 74.1 | 75-3 | 372.7 | 374.0 |
| 990 | 2895 | 8.003 | 7.945 | 22.2 | 21.9 | 74.1 | 72.6 | 355.8 | 367.3 |
| 400 | 829 | 5.991 | 5.934 | 26.8 | 26.7 | 88.2 | 88.5 | 411.3 | 412.2 |
| 760 - | 866 | 6.633 | 6.639 | 26.8 | 26.6 | 88.2 | 87.8 | 393.1 | 389.1 |
| • | 4243 | | 6.885 | 26.8 | 27.4 | 88.2 | 90.0 | 389.3 | 382.0 |
| | 1514 | | 7.397 | 26.8 | 26.9 | 88.2 | 88.5 | 375.6 | 381.6 |
| 243 | 523 | 5.493 | 5.338 | 31.5 | 31.4 | 102.2 | 102.3 | 430.7 | 433.1 |
| 400 | 644 | 5.991 | 6.042 | (31.5) | 31.4 | (102.2) | 0.101 | 413.0 | 413.3 |
| 460 | 461 | 6,131 | 6.101 | 31.5 | 31.9 | 102.2 | 103.4 | 408.0 | 401.7 |
| 760 | 858 | 6.633 | 6.527 | 31.5 | 30.9 | 102.2 | 100.3 | 396.0 | 395.4 |
| • | 935 | | 6.414 | 31.5 | 31.6 | 102.2 | 102.8 | 395.7 | 393.1 |
| | 1149 | | 6.435 | 31.5 | 31.0 | 102.2 | 100.7 | 394.0 | 389.7 |
| | 317 | | 5.523 | 36.1 | 36.7 | 116.2 | 117.4 | 427.0 | 426.7 |
| | 233 | | 5.448 | 36.1 | 36.5 | 116.2 | 117.1 | 429.0 | 321.4 |
| 54 | -354 | 3.996 | 4.216 | 40.7 | 40.4 | 130.2 | 129.2 | 467.7 | 478.2 |
| | -324 | | 0.206 | 24.7 | 24.8 | 86. r | 85.6 | 410.0 | 409.7 |
| 230 | 35 | 5.438 | 5.407 | 29.4 | 29.2 | 100.2 | 99.8 | 434-3 | 440.6 |
| - | 377 | | 8.931 | 17.0 | 16.9 | (58.1) | 58.5 | | |
| | -1341 | | 11.885 | (15.4) | 16.2 | (56.1) | 54.7 | | |
| | -91 | | 7.338 | 26.3 | 25.3 | 86.1 | 83.4 | | |

^a Values of molar heat of vaporization (kcal/mole), vapor pressure (Torr), molar refraction (cc/mole) and boiling point ($^{\circ}$ K) were taken from ref. 12.

^b The boiling point test was only tried on the saturated alcohol data.

properly defined, then it is anticipated that methanol will have a value close to zero and the secondary alcohols will have values near two on the scale. The results for this test are shown in Table III. The fit between the test and predicted points is excellent, and the predicted values for methanol and the secondary alcohols are as expected. However, the cyclic and unsaturated alcohols have predicted values smaller than the number of substituent carbons attached to the hydroxyl bearing carbon atom.

The substituent-effect test may be interpreted physically in terms of an induction effect. It is generally believed that methyl groups are electron donors and that unsaturated carbons are electron withdrawing centers. If the substituent effect test factor measures electron density on the carbon atom bearing the hydroxyl group, and, if the inductive effects are additive, then, as a first approximation, the test values one, two and three are justified for the primary, secondary and tertiary alcohols, respectively. The unsaturated alcohols, having electron withdrawing groups, should experience a negative inductive effect which would decrease the electron density at the carbon bearing the hydroxyl group. While the substituent test vector may also be affected to some extent by steric factors, the inductive effects appear to be the major factor influencing the vector. With this explanation, it is harder to understand the small predicted values for the cycloalcohols, which should have values near two. Our results for the two cycloalcohols imply that the cyclo group is behaving as an electron withdrawing group.

Heat of vaporization, vapor pressure and boiling point. The molar heat of vaporization appears to be a true factor of the retention index space (see Table III). Two functional forms of the solute vapor pressure were tested for identification with the abstract eigenvectors of the space: the solute vapor pressure and the natural logarithm (ln) of the vapor pressure. The results of both tests are shown in Table III. Of the two tests, ln vapor pressure gives a much better fit. Although a test of the reciprocal of the normal boiling point gave a moderately good reproduction of test points, the fit for the normal boiling-point test vector was also fair as shown in Table III.

Molar polarization. The fit for solute molar polarization is also shown in Table III. A few points were left unassigned in order to check the validity of the rotation. The agreement is excellent. This factor also tested well⁹ on the more general data of ROHRSCHNEIDER¹⁰. Tests of this type illustrate the power of factor analysis for predicting the mathematical form of unknown interaction terms. KIESLEV *et al.*¹³ recently postulated that the molar polarization is directly related to the heat of adsorption of a solute onto a surface.

Dipole moment. Test vectors for both dipole moment and dipole moment squared exhibited the correct trends, but several points in both vectors were in error by over 20%. This implies that the solute dipole moment occurs in an interaction term (which we recall must be written as a product of a solute term and a solvent term) with a power near one.

Dielectric constant. A dielectric constant test vector gave a moderately good fit, whereas a test of the reciprocal of the dielectric constant $1/\epsilon$ exhibited a very poor reproduction. The results were somewhat unexpected since ANVAER *et al.*¹⁴ found that $1/\epsilon$ was linear with log (retention volume) for a series of solvents.

Molecular weight. The excellent fit for the solute molecular weight test vector is surprisingly good. The fit for this test vector is shown in Table III. As a check on the vector, several of the solute points were omitted (points shown in parenthesis in Table III). The close agreement between the experimental and predicted values shows that, for this data matrix, molecular weight can be associated with a true factor of the space. The molecular weight test factor did not work well when applied to the retention index data of ROHRSCHNEIDER¹⁰ who measured the retention index of many different types of solutes⁰. These results indicate that one should be cautious in drawing general conclusions from a fit determined on one family of solutes.

Reproduction of the data matrix

If it is possible to identify each of the abstract eigenvectors of the space with a separate physically or chemically significant parameter, then these factors can be used to reproduce the data matrix. This last step of reproduction is quite important since, only if all factors, are accounted for in the test factors, will the data matrix be reproduced within experimental error. If all test factors fit well, but the data matrix cannot be reproduced from them, then at least two of the test factors are being rotated into the same eigenvector and the factor space is not being spanned.

Attempts to find five factors which span the space of the saturated alcohols met with considerable success. The following groups of five test vectors were tested for reproduction of the data matrix:

(A) 1, unity; 2, boiling point (°K); 3, molecular weight; 4, carbon number and 5, molar refraction.

(B) I, unity; 2, boiling point (°K); 3, substituent effect; 4, carbon number and 5, molar refraction.

(C) 1, unity; 2, ln vapor pressure; 3, substituent effect; 4, carbon number and 5, molar refraction.

(D) 1, unity; 2, heat of vaporization; 3, substituent effect; 4, carbon number and 5, molar refraction.

(E) I, unity; 2, molecular weight; 3, molar refraction; 4, carbon number and 5, substituent effect.

(F) 1, molecular weight; 2, molar refraction; 3, carbon number; 4, ln vapor pressure and 5, substituent effect.

TABLE IV

CONSTANTS NEEDED TO EVALUATE EQN. I

| Solvent | Letter | Constants ^a | | | | | | |
|------------------------------|--------------|------------------------|---------|---------|----------|-----------|--|--|
| | <u> </u> | C (1,a) | C (2,a) | C (3,a) | C (4,a) | C (5,a) | | |
| Apiczon L | Α | - 1262 | 4.338 | 4.273 | - 76.660 | 8.008 | | |
| Carbowax 600 | в | — 1 5 66 | 7.379 | 11.060 | 19.580 | - 45.890 | | |
| Carbowax 20M | С | 1836 | 8.136 | 0.008 | - 42.130 | - 2.473 | | |
| Dibutyl tetrachlorophthalate | D | -1217 | 4.822 | 1.765 | - 50.070 | 7.693 | | |
| Di-2-ethylhexyl sebacate | E | - 734 | 3.045 | 17.700 | 61.770 | - 56.960 | | |
| Diglycerol | \mathbf{F} | 1855 | 10.270 | -21.450 | 295.100 | 93.360 | | |
| Diisodecyl phthalate | G | - 1056 | 4.239 | 8.261 | 0.867 | - 20,160 | | |
| Dioctyl sebacate | H | - 725 | 3.029 | 17.410 | 63.460 | - 56.460 | | |
| Dow Corning 550 fluid | I | - 1010 | 3.774 | 15.210 | 16.990 | - 42.640 | | |
| Dow Corning FS 1265 fluid | J | - 969 | 3.926 | 15.230 | 19.740 | - 43.200 | | |
| Flexol 8N8 | K | - 1262 | 5.327 | - 0.712 | - 29.500 | 9.011 | | |
| Hyprose SP-80 | L | -1557 | 7.731 | 13.500 | 20.280 | - 55.300 | | |
| Igepal CO 880 | \mathbf{M} | - 1690 | 7.463 | - 1.308 | - 42.140 | 3.985 | | |
| Isooctyldecyl adipate | N | - 715 | 2.999 | 18.340 | 67.580 | - 59.990 | | |
| Pluronic F77 | 0 | -1743 | 7.556 | - 1.648 | - 39.170 | 4.205 | | |
| Polyphenyl ether-5 rings | \mathbf{P} | - 827 | 3.138 | 32.560 | 83.770 | - 105,900 | | |
| Quadrol | Q | -1732 | 8.133 | - 1.429 | - 23.960 | - 0.984 | | |
| SE-30 | Ř | - 1299 | 4.816 | 0.634 | - 51.770 | 11.570 | | |
| SE-31 | S | -1373 | 5.032 | - 4.416 | - 84.750 | 32.870 | | |
| SE-52 | Т | - 1257 | 4.613 | 2.450 | - 47.610 | 6.124 | | |
| Sucrose acetate isobutyrate | ΰ. | - 985 | 4.448 | 16.260 | 45.940 | - 54.710 | | |
| TMP Tripelargonate | v | - 848 | 3.421 | 17.010 | 47.500 | - 53,060 | | |
| Tricresyl phosphate | W | -1340 | 5.659 | 6.596 | - 13.060 | - 17.970 | | |
| Ucon LB-1715 | Х | -1275 | 5.384 | 8.499 | 35.400 | - 33.020 | | |
| Zonyl E-7 | Y | -1114 | 4.975 | 3.035 | - 68.740 | 7.309 | | |

^a Numerals 1-5 represent unity, boiling point (°K), molecular weight, carbon number and molar refraction, respectively.

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The average column average error between predicted and experimental retention indices using each set of five test factors were as follows: A, 8.4; B, II.7; C, 29.0; D, 30.3; E, I8.3; F, 24.6 retention indices. Although the best fit, set A, is still not within experimental error, the major factors appear to be accounted for to a large degree by this choice.

It is now possible, by using set A, to establish a set of equations of the following form:

$$I(i, a) = \sum_{j=1}^{5} C(j, a) P(j, i)$$
⁽¹⁾

where $I(i,\alpha)$ is the retention index of solute, *i*, on stationary phase, α ; *j* corresponds to the five test factors in set A; $C(j,\alpha)$ corresponds to the five multiplicative constants associated with each solvent, α , which are calculated from the reproduction portion of the factor analysis program; and P(j,i) corresponds to the five parameters in set A evaluated for solute, *i*. The constants $C(j,\alpha)$ for the twenty-five solvents listed in Table II are shown in Table IV.

The validity of Eqn. 1 can be tested by calculating the retention indices on all twenty-five stationary phases of several solutes not included in the original data matrix but for which experimental retention indices are known. In Table V are listed

| TABLE | V |
|-------|---|
|-------|---|

PHYSICAL PROPERTIES, P(j,i), FOR ALCOHOLS NOT INCLUDED IN THE ORIGINAL DATA MATRIX¹

| Alcohol | Boiling point | Molecular weight | Carbon numberb | Molar refraction | |
|-----------------------|---------------|------------------|----------------|------------------|--|
| 2-Heptanol | 434 | 116.2 | 6.8 | 36.1 | |
| 2-Octanol | 453 | 130.2 | 7.8 | 40.7 | |
| 1-Nonanol | 487 | 144.2 | 9.0 | 45.4 | |
| 2-Methyl-cyclohexanol | 439 | 114.2 | 6.3 | 34.0 | |

^a All data taken from ref. 12. Boiling point in °K, molecular weight in grams, molar refraction in cc/mole.

^b Carbon number estimated using the rules given in this paper.

the properties, P(j,i), for four new alcohols not included in the original scheme. Using Eqn. 1, and the data in Tables IV and V, we can predict the retention indices of these four alcohols on all twenty-five stationary phases. The results of this test are shown in Table VI. Considering the simplicity of the five test factors and the complexity of the problem, the agreement is quite remarkable.

It might be possible with a different set of test factors to produce an even closer fit. Ideally, one should be able to come up with mathematical models for each of the five interaction parameters in terms of the properties of the solutes and stationary phases of the system. Until this stage is reached, however, empirical correlations such as those proposed here can be quite useful in aiding the chromatographer in choosing the best system for a given separation.

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TABLE VI

EXPERIMENTAL AND PREDICTED RETENTION INDICES FOR FOUR ALCOHOLS NOT INCLUDED IN THE ORIGINAL DATA

| | 2-Heptanol | | 2-Octanol | | n-Nonanol | | 2-Methyl- cyclohexanol | |
|-----------------------------|------------|-----------|-----------|-----------|------------------|-----------|---------------------------|-----------|
| | Exptl. | Predicted | Exptl. | Predicted | Exptl. | Predicted | Exptl. | Predicted |
| Apiezon L | 868 | 885 | 966 | 987 | | 1138 | 946 | 920 |
| Carbowax 600 | 1379 | 1398 | 1479 | 1502 | - 4 | 1712 | 1477 | 1499 |
| Carbowax 20M | | 1318 | 1 399 | 1419 | 1648 | 1630 | 1402 | 1385 |
| Dibutyl tetrachlorophtha- | | - | - | | | - | | |
| late | 999 | 1018 | 1101 | 1119 | | 1282 | | 1047 |
| Di-2-ethylhexyl sebacate | 990 | 1008 | 1090 | 1113 | 1-10 May | 1269 | 1045 | 1076 |
| Diglycerol | 1457 | 1473 | 1506 | 1502 | 1693 | 1631 | 1589 | 1519 |
| Diisodecyl phthalate | 1003 | 1022 | 1105 | 1126 | | 1290 | 1064 | 1068 |
| Dioctyl sebacate | 987 | 1006 | 1087 | 1110 | | 1267 | 1042 | 1073 |
| Dow Corning 550 fluid | 951 | 972 | 1053 | 1077 | * - • • • | 1236 | 1025 | 1041 |
| Dow Corning FS 1265 fluid | 1061 | 1079 | 1164 | 1188 | 6.54 F | 1354 | 1123 | 1149 |
| Flexol 8N8 | 1072 | 1092 | 1175 | 1195 | | 1370 | 1124 | 1116 |
| Hyprose SP-80 | 1478 | 1508 | 1590 | 1610 | | 1822 | 1587 | 1626 |
| Igepal CO 880 | 1241 | 1254 | 1338 | 1354 | | 1554 | 1323 | 1307 |
| Isooctyldecyl adipate | 994 | 1011 | 1094 | 1117 | | 1273 | 1047 | 1082 |
| Pluronic F77 | 1212 | 1230 | 1313 | 1331 | | 1534 | | 1282 |
| Polyphenyl ether5 rings | 1042 | 1065 | 1147 | 1177 | 1341 | 1341 | 1140 | 1196 |
| Quadrol | 1413 | 1433 | 1528 | 1539 | | 1758 | 479 | 1491 |
| ŠE-30 | 912 | 930 | 1012 | 1032 | | 1195 | 969 | 955 |
| SE-31 | 891 | 908 | 997 | 1008 | | 1168 | 965 | 915 |
| SE-52 | 909 | 927 | 1008 | 1029 | | 1190 | 969 | 956 |
| Sucrose acetate isobutyrate | 1154 | 1172 | 1258 | 1278 | 1467 | 1453 | 1222 | 1252 |
| TMP Tripelargonate | 1003 | 1021 | 1104 | 1127 | | 1288 | 1060 | 1091 |
| Tricresyl phosphate | 1125 | 1145 | 1229 | 1249 | 1 | 1431 | | I 204 |
| Ucon LB-1715 | 1080 | 1098 | 1181 | 1202 | 1397 | 1389 | 1142 | 1159 |
| Zonyl E-7 | 1183 | 1197 | 1288 | 1296 | | 1457 | | 1232 |

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