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Stationary-phase optimized selectivity in supercritical fluid chromatography using a customized Phase OPtimized Liquid Chromatography kit

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- 1 Stationary-Phase Optimized Selectivity in Supercritical Fluid Chromatography using a
- 2 customized Phase Optimized Liquid Chromatography kit: Comparison of different prediction
- 3 approaches
- 4
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Abstract

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The use of Stationary-phase Optimized Selectivity in Liquid Chromatography (SOS-LC) was shown successful for HPLC to analyze complex mixtures using a Phase OPtimized Liquid Chromatography (POPLC) kit. This commercial kit contains five stationary-phase types of varying lengths, which can be coupled to offer an improved separation of compounds. Recently, Stationary-Phase Optimized Selectivity Supercritical Fluid Chromatography (SOS-SFC) has been introduced, transferring the methodology to SFC. In this study, the applicability of a customized POPLC expert kit for isocratic SFC runs was explored. Five stationary-phase chemistries were selected as potentially most suitable for achiral separations of polar compounds: aminopropyl (amino), cyanopropyl (CN), diol, ethylpyridine (EP) and silica. The retention factors (k) on the individual stationary phases were used for the prediction of the best stationary-phase combination, based on the POPLC algorithm (via the included software). As an alternative, the best column combination was predicted using multiple linear regression (MLR) models on the results obtained from a simplex centroid mixture design with only three stationary-phase types (Amino, Silica and EP). A third approach applied the isocratic POPLC algorithm on the same three stationary-phase data. The proposed combinations were assembled and tested. The predicted and experimental retention factors were compared. The predictions based on the POPLC algorithm provided a stationary phase showing a complete separation of the mixture. The stationary phase suggested by the MLR-models on the other hand, showed co-elution of two compounds, due to an unexpected experimental retention shift. Overall, the customized POPLC kit showed good potential to be applied in SFC.

Keywords

- 41 Achiral SFC, Polar Stationary Phases, Stationary-Phase Optimization, Coupled Systems, Retention
- 42 Prediction

1. Introduction

Supercritical Fluid Chromatography (SFC) has established itself as a preferred technique for the separation of chiral compounds, especially at the preparative level [1]. The major benefits of the technique are related to the supercritical-fluid properties of carbon dioxide (CO₂) in the mobile phase. CO₂ is by far the most used supercritical fluid in SFC since it has a low critical pressure and temperature of about 73 bar and 31°C, respectively, and is non-toxic, non-flammable and naturally produced [2].

Supercritical fluids possess a higher diffusivity and a lower viscosity than liquid mobile phases, which allow run times to be 3 to 5 times shorter than in High-Performance Liquid Chromatography (HPLC) [3]. Higher flow rates, which reduce the overall analysis time and increase the throughput capacity, do not compromise the efficiency of the technique. Moreover, the optimal Height Equivalent to a Theoretical Plate (HETP), which is directly related to the column efficiency, is similar for SFC and HPLC. In sub/supercritical conditions, the chromatographic column is equilibrated in a few minutes [4]. The low viscosity of the supercritical fluids is also the property responsible for the lower pressure drop across the column, allowing the coupling of several stationary phases in series [5].

Following the research of Berger and Wilson [6], showing the considerably high efficiency of coupling columns in SFC, several studies have been performed on column coupling [7–14]. Phinney et al. [15] showed the potential benefits of such couplings in SFC by separating groups of structurally related compounds (β-blockers and 1,4-benzodiazepines), through connection of different achiral and chiral stationary phases under subcritical experimental conditions. The results indicated that using CO₂ may solve mobile-phase incompatibility problems encountered in HPLC experiments. On the other hand, Wang et al. [5] changed backpressure to optimize the separation of stereoisomers on coupled systems, showing also that the coupling sequence can be an important parameter affecting selectivity changes. West et al. [16] compared the tandem coupling of two complementary achiral columns with the results obtained on the individual columns, for impurity profiling of synthetic drugs. The tandem-column method provided some advantages, such as an improved peak capacity, compared to the single-column analysis.

Stationary-phase selection is the most critical step for method development, with samples' elution and retention depending mainly on the chemical properties of the selected phase [17]. However, with an extensive number of stationary-phase types available on the market, the selection of an adequate one may be less straightforward than hoped. The search for the proper stationary phase is challenging and typically based on the analyst's experience, literature information and often on trial-and-error approaches [18]. Additional steps in an optimization strategy include the selection of the mobile-phase composition, temperature, backpressure, flow rate, gradient slope and, occasionally, the use of different additives. All these factors can be varied to tune the selectivity depending on the properties of the analytes. When analyzing complex mixtures, the difficulty in achieving maximal resolution is even higher and often the use of one single column is not successful, not only in terms of resolution but also of analysis time [18].

Column coupling seems to be a promising approach for solving selectivity problems when analyzing complex mixtures. The term "serial tandem columns" is a synonym for coupled columns and consists of basically connecting two (or more) columns in series. Zero Dead Volume (ZDV) couplers are often used to assemble the systems because of the simplicity of connection [18]. The most significant advance in this approach was noticed with the commercialization of the POPLC (Phase OPtimized Liquid Chromatography) system, associated with the POPLC Optimizer Software [19]. The calculations of the retention are based on the PRISMA model, initially applied for mobile-phase optimization, and later adapted for stationary-phase optimization by Nyiredy et al [19,20]. In the latter approach, the stationary phase is the optimization parameter, where connection of segments with variable lengths and different chemistries may lead to an optimal separation. The commercialized POPLC kit includes five types of column segments (ProntoSIL C18-SH2, C18-EPS, Cyano, Phenyl and C30), each with five different lengths.

The first step is the screening of all compounds on a predefined length of each of the five types of stationary phases. The retention factor of each component in the mixture is predicted for all possible column combinations according to the following equation [19]:

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$$k_{A,B,C,D,E} = \frac{\sum_{i=A}^{E} \Phi_i k_i}{\sum_{i=A}^{E} \Phi_i}$$
 (Eq.1)

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where $k_{A,B,C,D,E}$ represents the retention factor predicted for a compound in a coupled system, and k_i the retention factor obtained for a compound on an individual stationary-phase segment (A-E). The symbol Φ is the effective length of a stationary phase. Afterwards, the column combinations can be ranked according to their ability to separate the critical peak pair and the combination providing the best separation can be selected.

The POPLC kit was already successfully used in HPLC for the separation of mixtures containing steroids [21], explosives [22], polymer electrolyte membrane degradation products [23], and synthetic thyroid hormones and their impurities [24]. Deconinck et al. [25-28] have successfully applied the POPLC method in the contexts of food-supplement analysis to screen several types of mixtures, containing analgesics, adulterated dietary supplements, PDE-5 inhibitors in food supplements and to develop herbal fingerprints of specific plants in plant food supplements. De Beer et al. [29,30] provided a solution for the largest drawback of the POPLC method, namely that it is developed for application in isocratic mode. This was based on applying a multiple step gradient for the separation of a mixture composed of compounds with a broad range of polarities. Furthermore, the same research group provided an algorithm allowing to use the POPLC kit in a linear gradient mode, accurately predicting the optimal column combination after inserting a minimum of three preliminary isocratic measurements on each individual stationary phase. This linear gradient approach was also applied to develop a green method, in which a "green" mobile phase, composed of ethanol and formic acid, was defined and the stationary phase was optimized using the POPLC kit [31]. The POPLC strategy was also used to predict the optimal combination of chiral columns to acquire baseline separation of a mixture containing four chiral pairs [32]. The experiments in isocratic mode did not provide a satisfying separation, in contrast to the prediction and experimental results obtained by the algorithms for gradient analysis. In addition to the implementation in HPLC, the application of the basic kit was tested in SFC by Delahaye and Lynen [33], thereby introducing the term Stationary-Phase Optimized Selectivity Supercritical Fluid Chromatography (SOS-SFC). With this approach, an acceptable separation of a mixture containing 15 achiral compounds was achieved. Subsequently, the same research group applied the SOS-SFC methodology to chiral mixtures, optimizing the separation further via the mobile phase density and the use of additives, such as isopropylamine and trifluoroacetic acid [34].

The aim of our actual study was to further investigate the suitability of the POPLC approach for SFC experiments. Five column chemistries were selected based on previous research by Galea et al. [17,35]. The selected chemistries are aminopropyl (amino), ethylpyridine (EP), cyanopropyl (CN), diol and silica, since these were identified as being the best stationary-phase types for the analysis of polar compounds in SFC. The intention was to adapt the kit and the methodology in the context of SOS-SFC. In this way, the kit is composed of normal-phase stationary phases, which are more interesting for implementation in SFC. Since these stationary-phase types are dissimilar, they are more likely to provide complementary separations, which could be beneficial to separate mixtures of structural analogues, such as impurities. An analgesics mixture was assembled in order to test the applicability of different prediction approaches on the customized kit.

2. Materials and methods

2.1. Instrumentation

All experiments were performed on the SFC Acquity® Ultra Performance Convergence Chromatography (UPC²) System from Waters® (Milford, MA, USA). The system consists of a binary pump, an autosampler with a fixed loop of $10~\mu L$, a convergence manager, a photo diode array (PDA) detector, a backpressure regulator and an external Acquity column oven without pre-heating system. During the analysis, the sample manager compartment was kept at 10° C for sample stability.

2.2. Chemicals and reagents

The solvent used was HPLC grade methanol (MeOH) purchased from VWR Chemicals (Fontenay-sous-Bois, France). CO_2 quality 4.5 (purity \geq 99.995%) was from Messer (Sint-Pieters-Leeuw, Belgium). Ammonium formate, used as mobile phase additive, was obtained from Sigma-Aldrich (Steinheim, Germany). The mixture consisted of analgesic compounds. All samples were prepared using HPLC grade MeOH. Compounds used for the mixture were acetaminophen, diclofenac, ibuprofen, ketoprofen, naproxen (Sigma-Aldrich, Steinheim, Germany), caffeine (Fluka, Neu-Ulm, Switzerland), codeine

hydrochloride, morphine hydrochloride (Bios Coutelier, Brussels, Belgium) and indomethacin (Sigma, St. Louis, MO, USA).

2.3. Test set

Since it was aimed to identify the benefits of using the kit for the separation of complex mixtures, a number of analgesic compounds, composed of acetaminophen, caffeine, codeine, diclofenac, ibuprofen, indomethacin, ketoprofen, morphine and naproxen, was mixed. These nine analgesics cover a variety of molecular structures and were arbitrarily selected to assemble a mixture that was difficult to separate. Some compounds are structural analogues, e.g. ibuprofen, ketoprofen and naproxen (arylpropionic acid derivatives); morphine and codeine (opioids). Each individual compound solution contained 1 mg/mL in methanol. To prepare the mixture, 1.0 mL of each individual solution and 1.0 ml MeOH were added to a 10 mL tube, resulting in final concentrations of 0.1 mg/mL for each component. Both the individual solutions and the mixture were injected, in order to determine the elution sequence.

2.4. Customized POPLC Expert kit

The SOS-SFC method was developed using a customized POPLC Expert kit 250-5-SFC, commercialized by Bischoff Chromatography (Leonberg, Germany). The kit is composed of segments with lengths of 10, 20, 60 and 80 mm, and of two segments of 40 mm for each of the five stationary phases, which are ProntoSIL amino, cyano (CN), diol, ethylpyridine (EP) and silica. The columns have an internal diameter of 3 mm and the stationary phases all have particle sizes of 5 µm. The segments assembly is made via PEEK (PolyEther Ether Ketone) holders, with 10 mm and 20 mm cartridges, to support pressure. The kit also includes the holder pieces and inlet and outlet filters, necessary for the segments' assembly.

2.5. Mobile-phase composition

The fraction of MeOH necessary to elute the analgesic compounds was first evaluated in a segment with 100 mm length. A generic gradient was applied and the retention times (t_R) of the compounds recorded. The generic gradient starts at 5% MeOH and increases up to 40% over 10 min, that fraction of modifier

is kept for 5 min and then returns to the initial value of 5% in 0.5 min, at which the column is reequilibrated for 2 more min. The overall run time for each sample is 17.5 min. Equation 2 is used to calculate the modifier fractions C_e at which the compounds are eluting [36].

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$$C_e = C_i + \frac{C_f - C_i}{t_c} x (t_r - t_d - t_0)$$
 (Eq. 2)

where C_i and C_f represent the compositions at the start and end of the gradient, respectively, t_d is the instrument dwell time, t_r the residence time on the column, t_G the gradient time and t_0 the column void time. Then, the average modifier fraction was determined.

2.6. Chromatographic conditions

The runs were performed in isocratic mode with a mobile phase consisting of 15% MeOH with 10 mM ammonium formate in CO₂. This additive was selected according to Muscat Galea et al. [37]. The flow rate was 2 mL/min, the column oven was set at 25°C and the backpressure at 150 bar. The injection volume was 2 μ L and the detection wavelength 220 nm. The system void time (t_d) was determined by coupling a ZDV union. The column void time (t_0) for each column was measured with a length of 100 mm and marked as the first baseline disturbance observed with the blank injection. In the first step of the approach, the compounds are screened on the five separate stationary phases, using an arbitrary chosen length of 100 mm. When making combinations of different stationary phases, the longest stationary phase type was always coupled at the beginning of the column. The retention factors (k) were calculated as ($t_r - t_0$)/ t_0 , in which t_r represents the retention time of the compound.

2.7. Approach 1

The POPLC Optimization Software (version 1.04.03, Bischoff Chromatography, Leonberg, Germany) is included in the kit and allows the prediction of the 'optimal' and 'best' combination of segments (multiples of 10 mm segments) using equation 1. With the use of this equation, the selectivity α is calculated for all consecutive peaks, after which a ranking can be made of the α values for the critical peak pair of every column combination with the predefined total column length. The combined stationary phase, leading to the highest selectivity for the critical peak pair is selected, considering also the total analysis time. Furthermore, the algorithm of the software takes into account the efficiency of

the column, expressed as number of theoretical plates N. The efficiency of a combined column is calculated using the efficiencies of the elementary stationary-phase segments. After entering the retention times, column void time and plate counts on the pure stationary phases of 100 mm in the POPLC Optimization Software, it provides the predicted column combinations. The predictions were made, defining a maximum column length of 200 mm (to provide a wider variety of possible combinations) and a minimal resolution of 1.5 (since a resolution higher than 1.5 represents baseline separation). The maximal analysis time was set at 30 min. The 'optimal' prediction is the combination, which meets the requirements for the resolution and has the shortest analysis time. The 'best' combination is that with the best chromatogram (best resolution and selectivity).

2.8. Approach 2

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The idea of approach 2 was to apply a mixture design to obtain the best result for the selectivity α . As in the original SOS-LC idea of Nyiredy et al. [19] a triangular domain of possible combinations between three stationary-phase types with a certain total column length was examined. In this mixture-design approach, the variables are the lengths of the stationary-phase types, of which two are independent and one is dependent at a selected total column length [38,39]. Instead of applying the classical equation based on the addition of the retention factors, MLR models were built for the retention based on the results from a 7-points simplex centroid mixture design. The obtained response surface models were used to predict the retention of different points in the triangular domain, which in turn allowed the prediction of the selectivity at these points. The goal of this approach is to predict the column-segments combination with the best selectivity α of the worst separated peak pair. For the mixture design, a simplex centroid design was chosen, which required seven measurement points for three segments: (1, (0, 0), (0, 1, 0), (0, 0, 1), (0.5, 0.5, 0), (0, 0.5, 0.5), (0.5, 0, 0.5) and (1/3, 1/3, 1/3). However, when coupling segments with a minimal length of 10 mm, the centroid could not be assembled for a total column length of 100 mm. Therefore, this point was shifted towards stationary phase composition (0.4, 0.3, 0.3) (see Fig. 1). In practice, this means that the three 100 mm individual stationary phases, three 50 mm - 50 mm combinations of two stationary-phase types and the 40 mm - 30 mm - 30 mm combination of the three column types should be measured. With the results at these seven points, multiple linear regression (MLR) models or response surfaces with the following type of equation were built for each compound:

$$\log k = b_0 + b_1 x_1 + b_2 x_2 + b_3 x_3 + b_{12} x_1 x_2 + b_{13} x_1 x_3 + b_{23} x_2 x_3 + b_{123} x_1 x_2 x_3$$
 (eq. 3)

where log k is the logarithm of the retention factor for a compound in the coupled system, x_i the relative lengths of stationary phases 1, 2 or 3, b_0 the intercept and b_i , the estimated coefficients.

The three selected stationary phase types were Amino, Silica and EP. When setting the total column length to 100 mm, 66 possible combinations (multiples of 10 mm) can be assembled (see grid points in **Fig. 1**). With the MLR-models for each compound, the log k and k values can be estimated for each column combination. When sorting the k values, the selectivity (α) can be calculated for each consecutive peak pair. The minimal α -value of every stationary phase combination can be visualized in an α_{min} plot and then the maximal is selected. This value represents the column combination for which the best separation of the critical peak pair is achieved.

2.9. Approach 3

A third approach was to perform predictions based on the POPLC algorithm with the three stationary-phase types selected for approach 2, i.e. Amino, Silica and EP. Based on the retention factors obtained from the measurements on 100 mm of each column, the corresponding k-values for all possible combinations of these three stationary-phase types (with a total length of 100 mm) were calculated using equation 1. For the 66 potential combinations (multiples of 10 mm), the retention factors were ranked and the α -values calculated. The stationary phase with the highest predicted α -value for the critical peak pair was selected and assembled to measure the mixture.

2.10. Procedure and software for data analysis

Empower[®] 3 V7.10 software 2010 (Waters, Milford, MA, USA) was used for data acquisition and processing, i.e. retention times (t_r) , retention factors (k), USP resolutions (Rs) and USP plate counts (N) are determined for all injections. The resolutions were calculated as $2(t_{r2} - t_{r1})/(w_1 + w_2)$, in which w represents the peak width at the baseline, applying the tangent method. The plate counts were calculated

as $16 \, (t_r/w)^2$. The POPLC Optimizer Software was used to predict the 'optimal' and 'best' combinations of approach 1 and to provide the predicted chromatograms at these combinations. Multiple linear regression (MLR) models were calculated with m-files written in MATLAB® 2014a (The Mathworks, Natick, MA, USA). The α_{min} plot for the mixture design was drawn with the ggtern package [40] in RStudio version 1.2.5019 (RStudio Inc., Boston, MA, USA). Microsoft® Excel (Microsoft Office Professional Plus 2016) was used to calculate relative deviations (|measured – predicted value|/average value) and selectivities (α), and to create scatter plots. Furthermore, it was used to calculate the k-values for approaches 2 and 3.

3. Results and discussion

3.1. Basic measurements on 100 mm of each stationary phase type

It was challenging to establish a chromatographic method that allowed a good separation of the selected analgesics group, which presents heterogeneity in terms of molecular properties. A mobile phase with 10 mM ammonium formate and 15% MeOH as the average percentage necessary for the elution of all compounds on the Amino column was selected using equation 2. Thereafter, the mixture was screened on each stationary phase type with 100 mm column length. The most retained compound was morphine (peak 8), eluting at 21.5 min from the silica stationary phase. All individual retention times and corresponding retention factors for the nine compounds on the different segments are presented in **Table S1** (in the Electronic Supplementary Material (ESM)). The chromatograms obtained with the individual stationary phase segments, in the screening step, are shown in **Fig. 2**. None of the stationary phases fully separated the analgesics mixture. However, different elution sequences are observed, suggesting that combining segments of the various stationary-phase types could possibly provide a baseline separation of all compounds.

To assess the dissimilarities S between the different stationary phase types for this analgesics mixture, the correlation r² between the retention factors was used in the following equation [41,42]:

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$$S = 100 \text{ x} \sqrt{1 - r^2}$$
 (Eq. 4)

S values close to 100 show a high dissimilarity between columns, while a value close to 0 indicates a similar separation on two columns. The results (see **Table 1**) show that the highest dissimilarity is found between the column types Silica – Amino and CN – Amino. On the other hand, the retention on the CN and Silica column shows high similarity (low S).

3.2. Approach 1

A next step consisted of entering the retention times, column void times and plate counts obtained by the measurements on 100 mm of the individual stationary phases (**Table S1 in the ESM**) in the POPLC Optimizer Software, applying equation 1 and determining that the critical peak pair consisted of naproxen and ketoprofen for all advised predictions. The 'optimal' (meeting the requirements for the resolution in the shortest analysis time) and 'best' combination (the best possible result for resolution and selectivity) were both predicted via the POPLC Optimizer Software, setting the maximal analysis time at 30 min. The proposed 'optimal' combination for a minimal resolution of 1.5 and a maximal column length of 200 mm was 60 mm CN + 20 mm Amino + 10 mm EP. However, this combination led to a chromatogram where only seven peaks were observed: a co-elution of naproxen (peak 5), ketoprofen (peak 6) and codeine (peak 2) occurred (**Fig. 3 (a)**). This was caused by earlier elution of ketoprofen (peak 6) and codeine (peak 2) than predicted (13.9% and 29.7% relative deviation for the retention factors, respectively; see **Table 2**). Furthermore, a large deviation could also be noticed for the retention factor of morphine (peak 8) (18.6%).

To improve the experimental separation of the predictions of the 'optimal' combination, a minimal resolution of 2 was requested, leading to the predicted combination of 80 mm CN + 30 mm Amino + 10 mm Diol. The analysis of the analgesics mixture on this column composition led to an improved separation (**Fig. 3 (b)**). However, four peak pairs showed a resolution below 1.5, with a minimal value of 0.98 for indomethacin (peak 7) and codeine (peak 2) (**Table 2**). Once again, the largest relative deviation in retention factors could be assigned to codeine (peak 2) (8.4%) and morphine (peak 8) (8.9%). It may be noticed that both above suggested column combinations are shorter than 200 mm, most likely to obtain the shortest analysis times, as requested for the 'optimal' combinations.

As mentioned above, this POPLC Optimizer software approach also provides the possibility to estimate the 'best' combination. In this case, less focus is put on the speed of the separation, while achieving the best resolution and selectivity is preferred. This 'best' combination, when a minimal resolution of 1.5 and a maximal length of 200 mm were entered as parameters, was 110 mm Silica + 50 mm Amino + 40 mm CN. This segment combination led to a complete baseline separated chromatogram (**Fig. 4**). The lowest resolution (2.00) was obtained between the peaks of naproxen (peak 5) and acetaminophen (peak 4) (**Table 2**). However, the use of this 200 mm long column implied a prolonged analysis time (25 min) compared to the shorter column combinations, where a total analysis time of approximately 3 and 4.5 min for 90 mm and 120 mm columns was achieved (in both cases without baseline separation!), respectively. For a shorter analysis, this run could possibly be further optimized by applying a gradient elution. This would allow for the same selectivity with a faster elution of the later eluting compounds.

3.3. Approach 2

The application of a simplex centroid mixture design was evaluated as an alternative to the SOS-LC approach. However, for this methodology, only three types of stationary phases were considered simultaneously. Amino, Silica and EP were the selected stationary phase types for the measurement of the mixture on seven column combinations. The selection was made based on the S values in **Table 1**: these three stationary phase types showed an overall high value in terms of dissimilarity. Furthermore, because the combinations CN - silica and diol - EP showed higher correlations, they were not considered together. Seven measurements (see **Fig. 1**) were required for this approach: the vertices, midpoints of the sides of the triangle and a point near the centroid (40 mm Amino + 30 mm Silica + 30 mm EP). The obtained retention factors (see **Table S1** and **Table S2** in the Electronic Supplementary Material (ESM)) were then used in the calculations to search for the best stationary-phase combination. Only combinations with a total column length of 100 mm were used in the predictions, leading to a total of 66 theoretical combinations (step size 10 mm, see **Fig. 1**). With multiple linear regression (MLR) models as in equation 3, the retention factors k on each column-fragment combination were modelled. From the predicted k values, the selectivities α for consecutive peaks were estimated and the minimal selectivity α_{min} , i.e. α for the worst separated peak pair, indicated for each stationary-phase composition.

The column composition where α_{min} is maximal specifies the best predicted separation for the worst separated peak pair. The α_{min} values were visualized by plotting them in a ternary phase diagram (**Fig.** 5).

It can be noticed, that the combinations between only EP and Amino, on the one hand, and the Silica and EP combinations, on the other, seem to provide poor separations. An area of improved separations is observed in the range, where the relative length of the EP segment is below 0.4, the Silica segment between 0.3 and 0.7 and the length of the Amino segment between 0.3 and 0.6. The highest α_{min} value could be found at a combination of 60 mm Silica + 40 mm Amino. The worst separated peak pair on this stationary phase was predicted to be naproxen - ketoprofen. However, as seen in Fig. 6 (a), a coelution of codeine (peak 2) and diclofenac (peak 9) is noticed when testing this column combination. Large shifts in retention can again be seen for codeine (peak 2) and morphine (peak 8) (the last two eluting compounds), resulting in an unforeseen overlap between codeine (peak 2) and diclofenac (peak 9) (Table 3). For these compounds, a larger decrease than expected for the retention factors was noticed. The other compounds were all baseline separated with the lowest resolution between naproxen (peak 5) and ketoprofen (peak 6) (Rs 1.68). To verify whether a longer total column length could promote the separation, the same fraction ratio was used in a 200 mm column, leading to a combination of 120 mm Silica + 80 mm Amino (see Fig. 6 (b)). This stationary-phase combination indeed led to a baseline separated chromatogram of the mixture. This observation could be attributed to a prolonged retention of codeine (peak 2), which moreover resembles the predicted retention factor better than that on the 100 mm column. However, notice that the total analysis time of the analgesics mixture almost tripled compared to the measurements on the 100 mm column.

3.4. Approach 3

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As a comparison to the predicted stationary-phase combination obtained from approach 2, predictions were performed using equation 1 on the same three stationary phases: Amino, Silica and EP. The retention factors of the nine compounds were predicted for the same 66 theoretical combinations and a total column length of 100 mm, based on the data from the basic measurements on 100 mm columns. Afterwards, identical steps were considered to predict the separation of a given stationary-phase

composition. A maximal α_{min} for the critical peak pair was now predicted for a stationary phase combination composed of 70 mm Silica + 30 mm Amino. Although there was little difference compared to the composition retrieved from approach 2, a full baseline separation was now achieved (**Fig. 6 (c)**). The sequence of elution remained the same in both cases, as well as the overall analysis time (8.5 min). Naproxen (peak 5) and ketoprofen (peak 6) proved to be the most difficult to separate, with a resolution of 1.53 (**Table 4**). Once more, a large difference could be noticed in the predicted and measured retention times of the last two eluting compounds: codeine (peak 2) (4.44 min instead of 8.73 min) and morphine (peak 8) (7.95 min instead of 15.90 min). Overall, larger relative variations of retention factors could be observed compared to the stationary-phase combinations tested with the other approaches, with relative differences ranging from 11.4% to 69.0%.

3.5. Comparison of the prediction approaches

Three alternative approaches for the prediction of the best stationary-phase combination were evaluated. The use of the POPLC Optimizer Software accompanying the kit, allowed the selection of different responses, such as the desired minimal resolution or selectivity, maximal length of the column and the maximal time of analysis. However, the two tested 'optimal' combinations, obtained for minimal resolutions of 1.5 and 2, and a maximal column length of 200 mm, did not provide a baseline separation of the mixture. The 'best' combination with approach 1, calculated for a minimal resolution of 1.5, allowed a complete baseline-separated chromatogram.

Approach 2, using equation 3 models to predict the k and α values, which thereafter are ranked to find the best predicted separation for the critical peak pair, seemed to be less successful, with a coelution of two compounds. Furthermore, to simplify the combination, only three of the five stationary-phase types were selected for the measurements and calculations. The selection was based on dissimilarities between the stationary-phase chemistries. A total column length of 100 mm was chosen, the same length as the basic measurements, leading to 66 possible column combinations. In this way, the same pressure and density will be obtained as with the basic measurements, together with overall shorter analysis times in contrast to longer columns. To obtain enough data points for the calculations

of approach 2, seven column combinations were assembled. In contrast, only five and three basic measurements (100 mm of each individual column type) are needed for approaches 1 and 3, respectively.

Approach 3, using the same three stationary-phase types as approach 2 and a column length of 100 mm, proposed a column combination capable of separating the mixture. With both approaches 2 and 3, the largest deviations from predicted retention factors were found with codeine and morphine. Both compounds are structural analogues and exhibit the strongest basic properties of the mixture. Furthermore, these two compounds eluted last in most tested column combinations, which makes them potentially more difficult to predict. Overall, larger deviations in predicted retention factors were noticed with approaches 2 and 3, compared to approach 1. Doubling the length of the column combination obtained with approach 2 did indeed give a completely separated mixture.

4. Conclusions

The applicability of a customized POPLC kit in supercritical fluid chromatography was examined using an analgesics mixture. The kit consisted of five stationary-phase types, specifically chosen for their applicability in SFC, which could be easily combined to achieve a better separation of complex mixtures. Two out of the three approaches (i.e. those using the POPLC algorithm) used to predict the best possible combination indicated conditions that fully baseline separate the mixture. Approach 2 (using a different equation than the POPLC algorithm to predict the best combination) did not predict conditions that gave a complete separation. Large deviations between predicted and measured retention factors were noticed, especially on the shorter columns. With the 90 and 100 mm columns, the retention times of especially codeine and morphine seemed difficult to predict, leading to the highest relative deviations of their measured retention factors. Both compounds elute last in the column combinations of approaches 2 and 3, which make their prediction even more difficult. As a general trend, the longer the total length of the column, the better the overall predictions seem to be. However, this phenomenon should be confirmed from additional separations considering different mixtures.

In conclusion, the customized POPLC kit can successfully be used for experiments in SFC.

Nevertheless, due to some experimental shifts in the predicted retention times, it may be necessary to

test several predicted combinations. This implies that the POPLC algorithm is possibly too simplified for the application in SFC, where pressure and mobile-phase density are of a larger importance than in HPLC. The experiments have only been conducted in isocratic mode in this study. The applicability of the approach in gradient mode to possibly enhance the separation of the compounds has yet to be tested. The complementarity of the isocratic POPLC and the gradient optimizations for compounds with similar and different polarities, respectively, may also be another topic for future research. Furthermore, the use of longer columns or changing the backpressure could possibly fine-tune the separation of the mixture on failed stationary-phase combinations.

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6. Conflict of Interest

The authors declare that they have no conflict of interest.

Tables

422 Table 1 Dissimilarity S for the retention factors obtained on the five column types

Column	Amino	Silica	EP	Diol	CN
Amino	0				
Silica	99.67	0			
EP	68.70	85.94	0		
Diol	89.27	61.16	38.08	0	
CN	99.80	16.91	82.90	57.72	0

Table 2 Retention factors (k), selectivity (α) and resolutions (Rs) for the analgesics mixture measured with the different combinations of approach 1: **A.** 60 mm CN + 20 mm Amino + 10 mm EP, **B.** 80 mm CN + 30 mm Amino + 10 mm Diol, and **C.** 110 mm Silica + 50 mm Amino + 40 mm CN. Peak numbering, see **Fig. 2**

п		Retention factor (k)			Selectivity (
Combination				Relative			Relative	Measured
mbir				deviation			deviation	resolution
Co	Peak	Measured	Predicted	(%)	Measured	Predicted	(%)	(Rs)
	1	0.51	0.55	6.76	-	-	-	-
	3	1.28	1.33	4.18	2.48	2.42	2.59	3.86
	4	2.75	2.88	4.46	2.16	2.16	0.29	4.43
	5	3.13	3.24	3.63	1.14	1.13	0,84	0.82
A	2	3.13	4.22	29.68	1.00	1.17	15.95	0.00
	6	3.13	3.59	13.90	1.00	1.11	10.28	0.00
	7	4.45	4.69	5.18	1.42	1.11	24.60	2.57
	8	7.07	8.52	18.58	1.59	1.82	13.43	3.96
	9	9.38	9.84	4.78	1.33	1.16	13.83	2.57
	1	0.52	0.51	2.50	-	-	-	-
	3	1.46	1.40	4.45	2.80	2.75	1.95	6.15
	4	2.98	2.92	1.89	2.04	2.09	2.57	6.17
	5	3.59	3.42	4.71	1.21	1.17	2.82	1.86
В	6	4.06	3.84	5.45	1.13	1.12	0.74	1.19
	2	4.73	4.35	8.38	1.17	1.13	2.94	1.44
	7	5.25	5.00	4.81	1.11	1.15	3.58	0.98
	8	9.90	9.06	8.91	1.89	1.81	4.11	6.50
	9	11.01	10.63	3.53	1.11	1.17	5.39	1.14
	1	0.90	0.88	2.32	-	-	-	-
	3	1.61	1.62	0.28	1.78	1.83	2.60	6.26
	4	3.20	3.12	2.46	1.98	1.93	2.75	8.58
	5	3.70	3.77	1.92	1.16	1.21	4.38	2.00
C	6	4.45	4.54	2.07	1.20	1.20	0.15	2.59
	7	5.87	6.06	3.32	1.32	1.34	1.25	4.05
	9	10.94	11.30	3.21	1.86	1.86	0.11	8.73
	2	22.92	23.51	2.53	2.10	2.08	0.68	12.36
	8	42.35	43.35	2.34	1.85	1.84	0.19	12.66

Table 3 Retention factors (k), selectivity (α) and resolutions (Rs) for the analgesics mixture measured on the best combination predicted with approach 2: 60 mm Silica + 40 mm Amino. Peak numbering: see **Fig. 2**

	Retention factor (k)			Selectivity (Measured		
			Relative			Relative	resolution
Peak	Measured	Predicted	deviation (%)	Measured	Predicted	deviation (%)	(Rs)
1	0.78	0.89	13.21	-	-	-	-
3	1.99	2.07	3.93	2.54	2.32	9.29	6.94
4	3.40	3.54	4.00	1.71	1.71	0.07	5.20
5	4.76	4.82	1.18	1.40	1.36	2.81	3.53
6	5.57	5.83	4.63	1.17	1.21	3.44	1.68
7	7.07	7.65	7.93	1.27	1.31	3.31	2.63
9	14.82	14.48	2.34	2.10	1.89	10.27	7.21
2	14.82	25.86	54.24	1.00	1.79	56.41	0
8	27.72	46.47	50.54	1.87	1.80	3.98	7.76

Table 4 Retention factors (k), selectivity (α) and resolution (Rs) for the analgesics mixture measured on the best combination predicted with approach 3: 70 mm Silica + 30 mm Amino. Peak numbering: see

434 Fig. 2

	Retention factor (k)			Selectivity (Measured		
			Relative			Relative	resolution
Peak	Measured	Predicted	deviation (%)	Measured	Predicted	deviation (%)	(Rs)
1	0.81	0.97	17.80	-	-	-	-
3	1.60	1.89	16.67	1.97	1.95	1.14	4.75
4	3.04	3.40	11.35	1.90	1.80	5.35	5.46
5	3.78	4.41	15.23	1.25	1.30	3.90	2.09
6	4.44	5.36	18.87	1.17	1.22	3.66	1.53
7	5.62	7.15	24.00	1.27	1.33	5.19	2.37
9	11.71	13.38	13.34	2.08	1.87	10.75	7.41
2	14.00	28.63	68.60	1.20	2.14	56.55	2.17
8	25.85	53.09	69.02	1.85	1.85	0.47	8.50

436 Figures

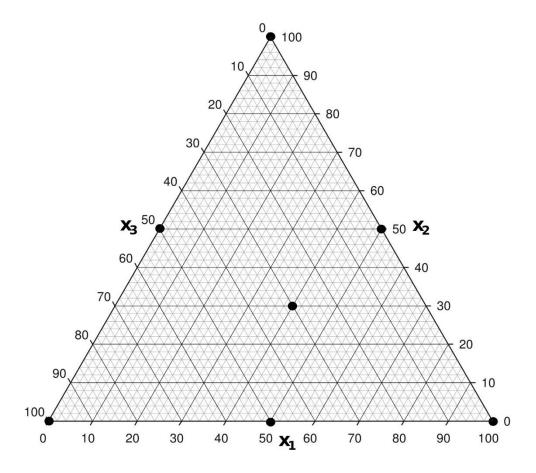


Fig. 1 Simplex centroid design for a ternary mixture with an 'adjusted centroid', leading to seven measurement points: (1, 0, 0), (0, 1, 0), (0, 0, 1), (0.5, 0.5, 0), (0, 0.5, 0.5), (0.5, 0, 0.5) and (0.4, 0.3, 0.3)

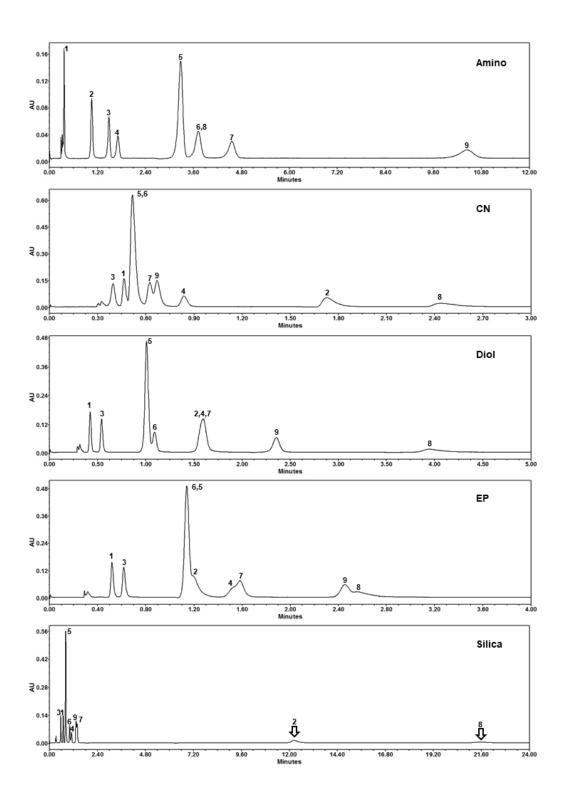


Fig. 2 Chromatograms obtained for the separation of the analgesic components on the five different segments (Amino, Cyano (CN), Diol, Ethylpyridine (EP) and Silica) with 100 mm length. Mobile phase: see text. A flow rate of 2 mL/min and a backpressure of 150 bar were applied. **1.** caffeine, **2.** codeine, **3.** ibuprofen, **4.** acetaminophen, **5.** naproxen, **6.** ketoprofen, **7.** indomethacin, **8.** morphine, and **9.** diclofenac

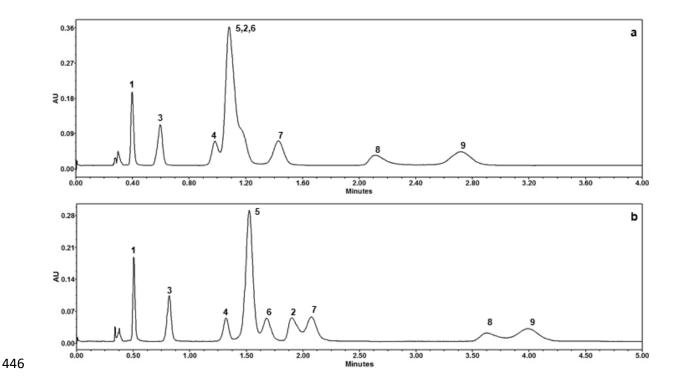


Fig. 3 (a) Experimental chromatogram for the 'optimal' combination, predicted minimal resolution of 1.5 and a maximal column length of 200 mm, for approach 1: 60 mm CN + 20 mm Amino + 10 mm EP. **(b)** Experimental chromatogram for the 'optimal' combination, predicted minimal resolution of 2 and a maximal column length of 200 mm, for approach 1: 80 mm CN + 30 mm Amino + 10 mm Diol. Flow rate: 2 mL/min. Backpressure: 150 bar. Mobile phase: see text. Numbering: see **Fig. 2**

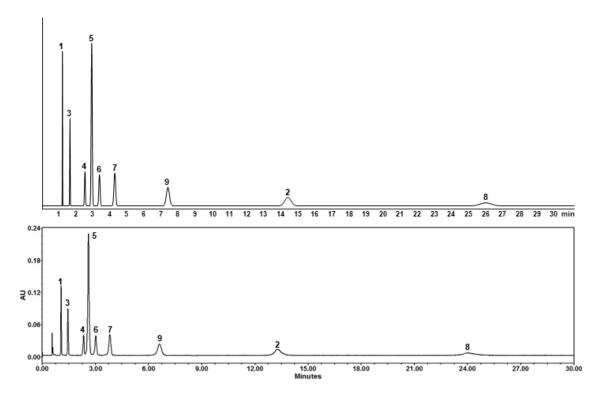


Fig. 4 Predicted (top) and experimental (bottom) chromatogram of the 'best' combination for the analgesics mixture, resulting from approach 1: 110 mm Silica + 50 mm Amino + 40 mm CN. Flow rate: 2 mL/min. Backpressure: 150 bar. Mobile phase: see text. Numbering: see **Fig. 2**

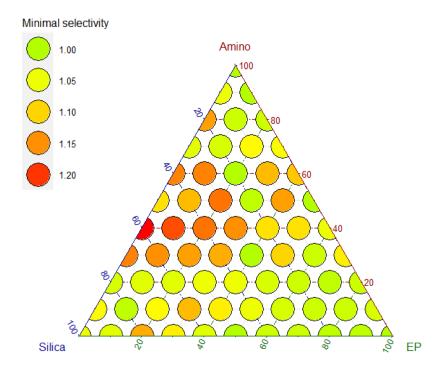


Fig. 5 Ternary phase diagram, showing the minimal selectivity α of each combination of 100 mm
 between the Amino, Silica and EP stationary-phase segments

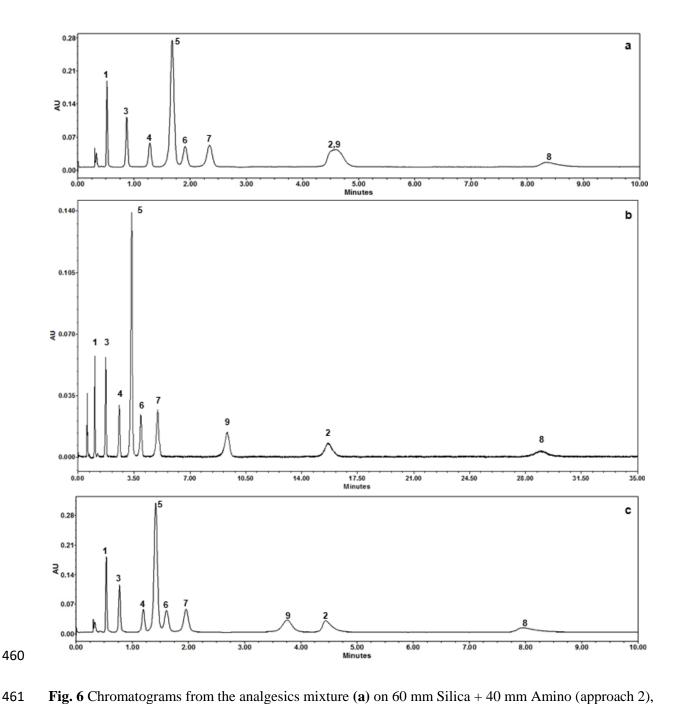


Fig. 6 Chromatograms from the analgesics mixture (a) on 60 mm Silica + 40 mm Amino (approach 2), (b) on 120 mm Silica + 80 mm Amino (longer column with the same ratio of the stationary-phase combination with approach 2), and (c) on the best prediction from approach 3: 70 mm Silica + 30 mm Amino. Flow rate: 2 mL/min. Backpressure: 150 bar. Mobile phase: see text. See **Fig. 2** for the peak identification

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