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► To cite this version:

Eliise Tammekivi, Magali Batteau, Dorothée Laurenti, Hugo Lilti, Karine Faure. A powerful twodimensional chromatography method for the non-target analysis of depolymerised lignin. Analytica Chimica Acta, 2024, 1288, pp.342157. 10.1016/j.aca.2023.342157 . hal-04396928

HAL Id: hal-04396928 https://hal.science/hal-04396928

Submitted on 16 Jan 2024 $\,$

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A powerful two-dimensional chromatography method for the non-target analysis of depolymerised lignin

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7 Abstract

<u>Background</u>: Lignin is an abundant natural polymer obtained as a by-product from the fractionation of
 lignocellulosic biomass. In the name of a circular economy, lignin should be valorised into valuable
 chemicals or biomaterials and utilised instead of petrochemicals. For the development of efficient
 valorisation processes, the structural characterisation of lignin can be highly beneficial. However, this
 is an arduous task, as the isolated (and sometimes processed) lignin mainly consists of various neutral
 monomers but also oligomers. In addition, the material contains isomers, which can be especially
 problematic to separate and identify.

Results: We present a powerful off-line comprehensive two-dimensional (2D) chromatography method 15 16 combining liquid chromatography (LC), supercritical fluid chromatography (SFC), and high-resolution 17 mass spectrometry for the non-target analysis of depolymerised lignin. The implementation of a 1-18 aminoanthracene column in the second dimension enabled a class separation of potential lignin monomers, dimers, trimers, and tetramers with an additional separation based on the number of hydroxyl 19 20 groups and steric effects. The pentafluorophenyl column in the first dimension additionally improved 21 the separation based on hydrophobicity. The comparison of off-line 2D LC×SFC to 1D SFC showed that besides the overall improved performance, the first method is also superior for the separation of 22 23 isomers. Advanced data analysis methods (MS-DIAL, SIRIUS, and Feature-Based Molecular Network) 24 were integrated into the non-target workflow to rapidly visualise and study the detected compounds, 25 which proved to be especially beneficial for the characterisation of the separated isomers.

Significance: The method yielded the first 2D LC plot demonstrating a classification of lignin compounds, which can be applied to compare various lignin sources and processing methods. In addition, the technique demonstrated improved separation of compounds, including isomers, which was especially beneficial as 77% of the detected compounds had at least one isomer in the same lignin sample.

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Abbreviations: ¹D, ²D: first and second dimension, respectively; 1D, 2D: one-dimensional and twodimensional chromatography, respectively; MN: molecular network; FBMN: feature-based molecular
network; HRMS: high resolution mass spectrometry; DDA: data-dependent acquisition; DIA: dataindependent acquisition; MtBE: methyl *tert*-butyl ether; DEA: diethylamine; 1-AA: 1-aminoanthracene;
BPC: base peak chromatograms; EIC: extracted ion chromatograms; GNPS: Global Natural Products

37 Social Molecular Networking; DBE: Double Bond Equivalent; log*P*: octanol-water partition coefficient

39 1. Introduction

40 Lignin is an abundant natural polymer that is by far the largest natural resource for aromatic compounds. Nevertheless, it is considered to be a low-value residue and is largely burned to power the pulp and 41 paper industry, where lignin is obtained by the fractionation of cellulose from lignocellulosic biomass.¹ 42 43 However, due to the legislations to decrease carbon dioxide emissions, there is an increasing demand to 44 use less petroleum and petrochemicals by replacing them with alternative natural resources. One 45 alternative could be lignin, as it has potential to be valorised into valuable aromatic compounds (e.g., vanillin, phenol), by incorporating them into materials (e.g., coatings, resins, thermoplastics, battery 46 electrodes), or transformed into additives for biofuel.^{1,2} As the first step in the pulp or cellulosic ethanol 47 industry, lignin is separated from the lignocellulosic biomass, which also contains cellulose and 48 hemicellulose. Depending on the final aim and valorisation process, the isolated lignin can be 49 50 depolymerised to a varying extent into smaller oligomers and/or monomers.³ However, for constructing efficient valorisation processes, thorough structural characterisation of the product and/or intermediates 51 52 can be highly beneficial.^{1,4}

- 53 Structurally, the polymeric lignin consists of randomly coupled three aromatic subunits (syringyl,
- 54 guaiacyl, and *p*-coumaryl) which, most commonly, are connected through β -O-4, β -5, β - β , 5-5, or 5-O-
- 4 linkages (Figure 1). The proportions of the monomeric subunits as well as the amount and type of the
- 56 linkages depend on the botanical origin of the lignin, thus yielding lignin polymers with highly varying
- 57 structures. In addition, largely because of the reactive hydroxyl groups that can lead to condensation and
- repolymerisation, it is very difficult to isolate lignin without inducing modifications in the structure.
- 59 Therefore, because of the variety in the original structure, the influence of the fractionation process, and
- 60 variations in depolymerisation, the structural analysis of lignin and products is highly challenging.³



61

62 *Figure 1*. An exemplary partial lignin structure and its main units – *p*-coumaryl (H, green), guaiacyl (G, purple),

and syringyl (S, red) shown in the structure. Examples of the main linkages (β -O-4, β -5, β - β , 5-5, 5-O-4) are highlighted by blue ovals. Above the lignin structure are the main subunits that by radical coupling form the lignin

65 structure.^{3,5}

One widely used method that can aid with obtaining detailed structural information about the 66 depolymerisation products is chromatography. Because of the complex structure of depolymerised 67 lignin, two-dimensional (2D) chromatography is applied more and more, as it has demonstrated higher 68 peak capacity and improved selectivity compared to one-dimensional (1D) chromatography.⁶⁻⁸ 2D gas 69 chromatography (2D GC, largely as GC×GC) is nowadays considered to be a standard method for the 70 analysis of processed biomass.⁹ However, with 2D GC commonly only lignin monomers and dimers are 71 detected, as larger oligomers are not volatile enough for GC.^{4,7} Volatility is less of an issue with liquid 72 73 chromatography (LC) and, indeed, 2D LC has been successfully applied for the analysis of poorly volatile or thermally unstable compounds, such as carotenoids¹⁰ or bioactive polyphenols¹¹. However, 74 2D LC has been much less applied for the analysis of biomass, as it is often problematic to hyphenate 75 76 two LC dimensions having non-correlated separation mechanisms (in other words, high orthogonality) such as NPLC×RPLC.⁴ In the case of depolymerised lignin, the sample generally consists of neutral 77 78 compounds, for which 2D LC methods combining reversed-phase LC (RPLC) and supercritical fluid chromatography (SFC) have demonstrated good orthogonality.¹² The studies by Sun et al.⁶ and Sarrut 79 et al.¹³ have already demonstrated some first advantages of applying LC×SFC for the analysis of 80 monomeric neutral compounds. However, to obtain more information about the separation and detected 81 82 compounds, mass spectrometry (MS) detection is compulsory. Together with fragmentation, high resolution MS (HRMS) is an indispensable tool to perform non-target analysis, where the aim is to detect 83 84 and annotate essentially as many analytes as possible without a prior analyte selection. Currently, only a small proportion of the compounds can be identified, as the non-target acquisition and data analysis 85 remain a challenge.¹⁴ Applying 2D separation before the MS detection can be highly beneficial, as the 86 87 improved separation will reduce the complexity caused by the number of co-eluting ions and at the same time decrease ion suppression, thus improving ionisation. These aspects can lead to identification with 88 89 higher confidence, detection of minor components, and a more reliable quantification when suitable 90 standards are available.¹⁵

For efficient and repeatable data analysis, more and more computational tools are emerging. In this 91 work, we applied MS-DIAL¹⁶ for peak picking, MS/MS deconvolution, peak alignment, and cleaning 92 93 of the MS/MS spectra. This software can use both data-dependent acquisition (DDA) and dataindependent acquisition (DIA) data as the input, which, after treatment, can be straightforwardly 94 exported in a format suitable for the Molecular Network (MN) analysis. The Global Natural Products 95 96 Social Molecular Networking (GNPS) platform organises detected features together based on their MS/MS spectral similarities.¹⁷ This has proven to be a powerful approach for the discovery of novel 97 components also in natural products.¹⁸ In recent years, the combined utilisation of 2D LC and MN for 98 the non-target analysis of natural products has increased. One of the major areas is the analysis of 99 traditional Chinese medicine using off-line methods combining RPLC with NPLC, HILIC, or mix-mode 100 LC.¹⁹⁻²² As far as we know, Qu et al.²³ and Wei et al.²⁴ have been the only ones to apply off-line LC×SFC 101 together with MN for the analysis of complex samples, in their case, traditional Chinese medicine. 102 103 However, in our work, we collected approximately three times more fractions from the first dimension (¹D) to decrease the under-sampling effect that substantially decreases the effective peak capacity of an 104 off-line 2D method.25 105

In the present study, the aim was to apply a powerful off-line comprehensive LC×SFC-HRMS/MS method for the non-target analysis of depolymerised lignin, which also includes oligomers higher than dimers. Particular focus was given to the separation and study of isomers with MN, as depolymerised lignin is expected to contain a high number of isomers. To our knowledge, this is the first study to combine a comprehensive 2D LC method with MS and apply it to the analysis of lignin.

112 2. Materials and methods

113 2.1 Chemicals and sample preparation

LC-MS grade methanol (MeOH) and methyl *tert*-butyl ether (MtBE) of HPLC grade were purchased from Sigma-Aldrich (Darmstadt, Germany), and formic acid (FA, 95-97%) from Aldrich. LC-MS grade acetonitrile (ACN) was purchased from Honeywell Riedel-de-Haën (Seelze, Germany) and pressurised liquid CO₂ (99.995%) from Air Liquide (Pierre Bénite, France). Water suitable for MS was produced

118 by using an Elga water purification system (Veolia water STI, Le Plessis Robinson, France).

Based on previously published studies,^{6,26-28} 33 phenolic standards were selected to represent 119 120 monomeric compounds that can be produced from lignin depolymerisation. All the following standards were purchased from Sigma-Aldrich (with numbering corresponding to Table S1 in the Supplementary 121 Information - SI): anisole (1); 2,3-benzofuran (2); 2,3-dihyrobenzofuran (3); eugenol (4); 2,4,6-122 trimethylphenol (5); 2,6-dimethylphenol (6); 2-phenylethanol (7); trans-isoeugenol (8); syringol (9); 123 124 2,5-dimethylphenol (10); 2-ethylphenol (11); o-cresol (12); m-cresol (13); 4-ethylphenol (14); p-cresol (15); phenol (16); acetovanillone (17); 3,4-dimethylbenzoic acid (18); acetosyringone (19); 125 syringaldehyde (20); 4-hydroxybenzaldehyde (21); 4-hydroxyacetophenone (22); coniferaldehyde (23); 126 4-methylcatechol (24); catechol (25); vanillyl alcohol (26); 4-hydroxybenzoic acid (27); hydroquinone 127 (28); ferulic acid (29); p-coumaric acid (30); 3,4-dihydroxyphenylacetic acid (31); pyrogallol (32); and 128

- 129 caffeic acid (33). Other characteristics of the standards are presented in Table S1 in the SI.
- 130 2.2 Sample preparation
- 131 From each monomer standard, single-compound stock solutions of 1 mg mL^{-1} in methanol were prepared
- and stored at 5 °C. From these stock solutions, five mix solutions containing five or six standards were prepared and diluted with MeOH with a final concentration of 0.1 mg mL⁻¹ for each monomer. To ease
- prepared and diluted with MeOH with a final concentration of 0.1 mg mL^{-1} for each monomer. To ease the MS interpretation, the standards were divided into mixtures (A, B, C, D, E, and F) so that monomers
- having the same molecular formula were in different mix solutions (Table S1 in the SI).

The depolymerised lignin sample was prepared by the following procedure, which will be presented in more detail in future publications focusing on the catalytic depolymerisation of lignin. Previously dried SODA P1000 lignin was depolymerised in a batch reactor in the presence of a CoMoS/Al₂O₃ catalyst and isobutanol at 280°C and 60 bar. The bio-oil was recovered by solubilisation in tetrahydrofuran

- 140 followed by filtration to remove the catalyst and evaporation of the solvents. The yielding solid mixture 141 was separated into two fractions by solubilisation in acetone and precipitation of the heavier fraction
- 141 was separated into two fractions by solubilisation in accord and precipitation of the neavier fraction 142 with *n*-heptane. After centrifugation, the supernatant (lighter fraction) was recovered and evaporated to
- dryness. From this oily solid, a solution of 30 mg mL⁻¹ was prepared in MeOH, sonicated for 10 min in
- 144 an ultrasonic bath, and the supernatant was collected for the chromatographic analyses.
- 145 2.3 Apparatus
- 146 The screening of columns for the SFC dimension was carried out using an Agilent (Santa Clara, CA,
- 147 USA) 1260 Infinity II UHPSFC system. A more detailed overview of the experimental conditions used
- 148 for the screening of columns is presented in Table S2 in the SI. The following columns, a Torus DEA
- 149 (diethylamine, $1.7 \mu m$, $3 mm \times 100 mm$), a Torus DIOL ($1.7 \mu m$, $3 mm \times 100 mm$), a Torus 1-AA (1-
- aminoanthracene, 1.7 μ m, 3 mm x 100 mm), and a CORTECS HILIC (1.6 μ m, 2.1 mm x 50 mm) were
- 151 purchased from Waters (Milford, MA, USA).
- 152 For the ¹D LC separation in the off-line LC×SFC analysis, an Agilent 1260 Infinity II HPLC system
- 153 was used, equipped with a binary solvent delivery pump (G7111A), an autosampler (G7129A) with a
- $154 \quad 900 \ \mu L \ loop$, a thermostated column compartment (G7116A, up to 90 °C), a diode array detector (DAD)
- with a 1 μ L flow-cell (G7117C), and a fraction collector with a capacity of 120 fractions (G1364F), all

from Agilent Technologies. The dwell volume was determined experimentally to be 2.65 mL. The 156 instrument was controlled by using the Agilent Openlab CDS Chemstation software. A Kinetex F5 157 column (5 µm, 4.6 mm x 150 mm) was purchased from Phenomenex (Torrance, CA, USA). The column 158 geometry was selected to allow the collection of fractions with a reasonable volume to be handled. A 159 miVac centrifugal vacuum concentrator (Genevac, Ipswich, UK) was used to evaporate the fractions to 160 dryness. For the ²D SFC separation, a Waters UPC² system equipped with a binary solvent delivery 161 pump, an autosampler with a 10 µL loop, a thermostated column compartment (up to 90 °C), a DAD 162 with an 8.4 µL flow-cell, a backpressure regulator (BPR), and a make-up solvent pump all from Waters. 163 The instrument was controlled by using Waters Empower CDS software. A 5 cm long Torus 1-AA 164 165 column (1.7 µm, 3 mm x 50 mm) was purchased from Waters.

For the accurate-mass tandem mass spectrometry detection, an Agilent 6560 Ion Mobility Quadrupole
Time-of-Flight (Q-ToF) instrument equipped with an Agilent Jet stream electrospray ionisation (ESI)
source was used. Agilent MassHunter Qualitative Analysis 10.0 was used for the extraction of base peak
chromatograms (BPC) and extracted ion chromatograms (EIC). The 2D plots of the off-line LC×SFC
measurement were visualised by using a Matlab (Mathworks) code developed in-house by S. Heinisch
and F. Rouvière.

- 172
- 173 2.4 Methods
- 174 2.4.1 Off-line 2D LC×SFC-Q-ToF-MS/MS conditions

175 The ¹D LC separation was performed using the Kinetex F5 column with H₂O containing 0.1 vol.% of 176 FA (A) and ACN containing 0.1 vol.% of FA (B). The column temperature was 30 °C and the injection volume was 10 µL. The flow rate was 2.1 mL min⁻¹ and the gradient was the following: 1% to 100% of 177 **B** in 9.0 min, held at 100% of **B** for 0.77 min (one column dead time), decreased back to 1% of **B** in 178 179 0.77 min, and equilibrated for 3.58 min. The Agilent fraction collector enabled the collection of 120 fractions into chromatographic vials with 250 µL inserts every 0.085 min starting after the column dead 180 time. Therefore, the fractions consisted of the effluent eluting during gradient time and dwell time. The 181 182 variability induced by the collection process is around 1%. After collection, the fractions were 183 evaporated to dryness. Then, a volume equivalent to the previously collected volume of MtBE was 184 added to the residue and the vial was vortexed for a few seconds.

185 The ²D SFC separation was performed using the 5 cm Torus 1-AA column with supercritical CO₂ (**A**) 186 and methanol as co-eluent (**B**). The column temperature was 40 °C and the injection volume was 7 μ L. 187 The flow rate was 1.4 mL min⁻¹, which was determined as the maximum flow rate accessible at 50% of 188 **B**. The gradient was the following: 5% to 50% of **B** in 3.6 min, decreased back to 5% of **B** in 0.2 min, 189 and held for 1.0 min to equilibrate the column. The BPR temperature and pressure were set to 70 °C and 140 bar, respectively. The DAD signal was registered at 210 nm and 254 nm.

The ²D SFC column was hyphenated to the MS by using the "preBPR splitter with a sheath pump" 191 configuration, described in more detail by Guillarme et al.²⁹ MeOH, with a flow rate of 0.5 mL min⁻¹, 192 was used as the make-up solvent. The ESI was performed in the negative ionisation mode under the 193 194 following parameters: drying and sheath gas temperature 350 °C with a flow of 11 L min⁻¹, nebuliser pressure 40 psi, capillary voltage 3.5 kV, and fragmentor voltage 185 V. The range of 90-1700 m/z was 195 set for the mass scan. All ions fragmentation (AIF) mode with two experiments – collision energy 0 eV 196 197 and 20 eV – were applied, which led to HRMS data for both MS^1 and MS^2 , respectively. The acquisition 198 rate was 3 spectra per second.

199 2.4.2 1D SFC-Q-ToF-MS/MS conditions

200 For the 1D SFC-Q-ToF-MS/MS analysis, the SFC method was modified to provide the optimal separation that a corresponding 1D method can give, therefore enabling a fair comparison between the 201 2D and 1D separation (see section 3.7). Therefore, the longer 10 cm Torus 1-AA column and a longer 202 gradient time (30 min) were selected. Because of these changes, other modifications had to be made. As 203 the slope of the separation was much lower, the analytes eluted at a lower final eluent concentration 204 205 (35% instead of 50%). In addition, because of the increased pressure caused by the longer column, the flow rate had to be decreased to 1.0 mL min⁻¹ corresponding to the maximum flow at 35% of co-eluent. 206 207 Therefore, the following gradient was applied: 5% to 35% of **B** (MeOH) in 30.0 min, 35% to 5% of **B** in 0.5 min, and equilibrated for 2.2 min. The other aspects of the 1D analysis (instrumentation, MS 208 parameters, etc.) were the same as in the ²D SFC component of the off-line LC×SFC-HRMS analysis. 209

210 2.4.3 Advanced data analysis

For the more detailed non-target analysis, a combination of feature detection, visualisation, and 211 annotation tools was applied. First, the raw Agilent MassHunter data files (.D) were converted to .ABF 212 (Analysis Base File) format using ABFConverter (Reifycs Inc., Tokyo, Japan). The data was processed 213 with MS-DIAL software version 4.9 (RIKEN Centre for Sustainable Resource Science, Kanagawa, 214 Japan) using the AIF multiple collision energies option. The mass tolerance was set at 0.01 Da for MS^{1} 215 and 0.025 Da for MS². For retention time, the range of 0.2-3.8 min was defined. For peak detection, an 216 217 amplitude of 20000 was selected as the minimum peak height with a mass slice width of 0.05 Da. For 218 deconvolution with the MS²Dec algorithm, 1000 was set as the MS/MS abundance cut-off and 0.5 as 219 the sigma window value. The ion species [M-H]⁻ and [M-H₂O-H]⁻ were defined. For peak alignment, 220 the last fraction (fraction 120) was selected as the reference with a retention time (t_R) tolerance of 0.2 min 221 and MS¹ tolerance of 0.02 Da. Removal of features based on blank filtering was selected. The results of the MS-DIAL processing were exported by generating an MS/MS spectral summary file (.MGF) and 222 feature quantification table (.txt). The results were also imported to the MS-FINDER software³⁰ to 223 224 determine the formula (mass tolerance ± 3 ppm) for each detected feature. The feature was excluded 225 from the files when a) there was no match with any $C_x H_y O_z$ formula, b) the DBE value corresponding to the formula was less than 4, c) the feature was likely a fragment as it had a similar chromatogram 226 227 with a higher m/z value (indicated by MS-DIAL), or d) the feature was also detected in consecutive fraction(s) at the same retention time. In the last case, only the feature with the most intensive signal 228 229 (representing the maxima of the peak) was kept. Here, this procedure was done manually; however, automatic "demodulation" processes are under development to convert 2D data into 1D data that can be 230 analysed with various novel softwares.³¹ In addition, intensive background signals that were present in 231 232 almost all MS² spectra (m/z 146.96, 188.94, and 119.95) were removed from the MS-DIAL output files. The edited output files were combined into one MGF and one .txt file containing all possible lignin 233 234 features. Both files were used to construct the Feature-Based Molecular Network (FBMN) on the GNPS 235 (gnps.ucsd.edu) platform.³²

Because of the size of the combined files, they were first uploaded to the MassIVE repository 236 237 (massive.ucsd.edu), after which they could be imported into the FBMN workflow on GNPS. MS-DIAL 238 was selected as the Quantification Table Source and 0.02 Da was set as the mass tolerance for both precursor and fragment ions. The following values were selected as the network parameters: 0.6 as the 239 minimum cosine score for a pair of consensus MS² spectra, 4 as the minimum number of shared fragment 240 241 ions, 10 as the maximum number of nodes for one single node, and 0 as the maximum connected component size, which allows the connection of unlimited number of nodes in a single network. The 242 default values were kept for the other input values. After running the FBMN workflow, the output 243 244 network files were downloaded from the GNPS platform and imported to the Cytoscape software 245 (version 3.9.1.) for visual editing.

- 246 For the structural characterisation of the detected features, the combined MGF file was imported and
- analysed in the SIRIUS software (version 5.6.3).^{33,34} By using this software, it is possible to propose the
- 248 molecular formula (SIRIUS) of a feature and elucidate its structure based on the fragmentation data 249 (CSI:FingerID³⁵). In the software, the MS^2 mass accuracy was set to 10 ppm, $[M-H]^-$ adduct was
- 249 (CSI:FingerID³⁵). In the software, the MS^2 mass accuracy was set to 10 ppm, $[M-H]^-$ adduct was 250 selected, and C, H, and O elements were allowed for the search of the molecular formula. The same [M-
- H^{-} adduct was selected for the fingerprint prediction and all the databases present in the software were
- applied for database search. In addition, the CANOPUS^{36–38} function in the same software was applied
- to predict the compound class.
- 254 2.4.4 Peak capacity and coverage of the 2D separation space
- Some figures of merit were calculated to characterise the performance of the 2D LC method for the analysis of this kind of depolymerised lignin sample. The most widely demonstrated values are peak capacity and orthogonality, which have proven to be suitable for the comparison of different 2D separation methods. However, as different methods can be used for the calculation of the values, we will briefly present the approaches used in this study.
- 260 The peak capacity (n_c) for a gradient separation can be individually estimated for both dimensions using 261 the corresponding gradient time (t_g) and average peak width as 4σ (w) in time units according to Eq. 1:
- $n_C = \frac{t_g}{w} \tag{1}$
- However, for 2D separations, it is necessary to include the under-sampling correction factor (β) to take into account the peak broadening caused by the under-sampling during the ¹D (in the formula noted as D_1) fraction collection, which can be done by Eq. 2 presented in the work by Li *et al.*³⁹:
- 266 $n_{C,corrected}^{D1} = \frac{n_{C}^{D1}}{\beta} = \frac{n_{C}^{D1}}{\sqrt{1+3.35 \times (\frac{t_{S}}{w^{1}})^{2}}}$ (2)
- where t_s is the sampling time. Under ideal conditions, the peak capacity of a 2D method can be calculated according to Eq. 3:
- 269 $n_{C,theoretical}^{2D} = n_C^{D1} \times n_C^{D2}$ (3)
- When combining Eq. 1, 2, and 3, the equation for effective 2D peak capacity can be obtained, which isa more realistic value, as it also takes into account the effect of under-sampling.
- 272 $n_{C,effective}^{2D} = \frac{n_{C}^{D1} \times n_{C}^{D2}}{\sqrt{1+3.35 \times (\frac{t_{s} \times n_{C}^{D1}}{t_{g}^{1}})^{2}}}$ (4)
- 273 The orthogonality was estimated using the convex hull approach.⁴⁰
- 274

275 3. Results and discussion

276 3.1 Screening of columns for the 2 D SFC dimension

The selection of the suitable column for the ²D SFC dimension was made based on the analysis of 33 monomer standards, which were selected to represent possible lignin monomers. Four columns were screened using generic gradient elution (5% - 50% of MeOH, normalised gradient slope of 3%, the other parameters can be seen in Table S2). With the Cortecs HILIC column, the majority of the standards co-eluted at dead time. In contrast, the Torus DEA column had very strong retention for some analytes 282 (pyrogallol; 3,4-dihyroxyphenylacetic acid; caffeic acid), causing peak broadening and difficulties with the detection of these compounds on the chromatogram. The strong retention of phenolic acids was also 283 noted by Prothmann et al.⁴¹ with Torus DEA and Torus 2-picolylamine columns. DIOL and 1-AA both 284 exhibited a good separation over a similar elution range with a ΔC_e (difference of mobile phase 285 286 composition at the elution of the most and least retained compounds) value of 22.3% for DIOL and 287 24.7% for 1-AA using the 33 monomer standards (Figure S1 in the SI). However, the 1-AA column has demonstrated a better separation of lignin monomers from dimers due to the enhanced selectivity 288 289 provided by the π - π interactions between the double bonds of lignin compounds and the aromatic anthracene stationary phase.⁴² As we expected that the depolymerised lignin sample involved in our 290 study contains other compounds besides monomers, we selected the 1-AA column to investigate if this 291 292 mechanism also aids the separation of higher oligomers in the 2D setup.

293

294 3.2 General characterisation of the off-line LC×SFC separation

To find the suitable elution ranges for the two dimensions, the depolymerised lignin sample was 295 separately analysed with RPLC and SFC. The gradient times, flow rates, and other relevant factors for 296 297 both dimensions were selected based on calculations that are presented in our previous study on the optimisation of an off-line LC×SFC method.²⁵ However, in the present work, we were able to collect 298 120 fractions instead of 80, which is beneficial for obtaining a higher effective peak capacity for the 2D 299 300 method. Indeed, using Eq. 4, a very high effective peak capacity value – 3218 – was calculated for the 301 LC×SFC method, demonstrating the high separation efficiency of the developed 2D method for the 302 analysis of depolymerised lignin.

303 Figure 2 presents the obtained LC×SFC-HRMS plot using the BPC signal. Based on the convex hull 304 approach, we calculated the coverage of the separation space to be 62%. Considering that the sample consists largely of neutral compounds with similar structures, the obtained value can be considered good. 305 306 When taking into account the partial occupation of the separation space, the corrected peak capacity for 307 the 2D method is 1995, which nowadays is still an unreachable value with 1D separations. In addition, as can be seen in Figure 2, there is no clustering of peaks on the upward or downward diagonals, 308 309 demonstrating the low correlation and suitability of the selected dimensions for the analysis of neutral 310 compounds present in depolymerised lignin.







313

314 3.3 MS-DIAL for the off-line LC×SFC-HRMS/MS data analysis

Depending on the data and research question at hand, different data analysis methods can be helpful in 315 interpreting the measured tandem mass spectra. For the data obtained with the technique used in this 316 study, an example is presented in Figure 3, showing the 2D plot for deprotonated C₁₆H₁₈O₄ and 317 exemplary MS¹ and MS² spectra for two separated peaks. It can be seen that these two compounds are 318 319 isomers with different fragmentation patterns and as the MS¹ and MS² spectra are clean of interfering signals and the MS^1 contains mainly just the pseudo-molecular ion, it was decided to apply mass-spectral 320 software for the data analysis. The main advantage of using MS analysis software is the increased speed 321 of the data analysis, which is especially beneficial in this study as the 2D analysis generated 120 data 322 323 files. In addition, it can yield MS/MS data analysable with other approaches (here SIRIUS and FBMN). In this study, MS-DIAL software was first applied, which detects features and associated fragments by 324 325 fitting the chromatograms of product ions to a precursor by using retention time.¹⁶



327 Figure 3. Example of mass spectra measured with the LC×SFC-HRMS method. In the first row is the LC×SFC-

- HRMS EIC contour plot (MS¹) of 273.11279 (\pm 5 ppm) m/z, which corresponds to the exact mass of deprotonated
- 329 $C_{16}H_{18}O_4$. In the second and third row are the spectra that represent exemplary MS¹ and MS² spectra corresponding
- to the two separated isomers (Peak 1 and Peak 2), respectively.
- 331

In addition to true features originating from the compounds of the sample, MS-DIAL can also pick up 332 333 so-called false features. These can be signal noise, system contamination, or in-source fragmentation.⁴³ Even with ESI, which is considered to be the softest ionisation technique, some compounds can have 334 in-source fragmentation.⁴⁴ Therefore, when there are many analytes eluting simultaneously, it becomes 335 more and more difficult to distinguish true features from fragments (false features), especially when the 336 337 analytes are very similar. In this study, we manually checked features for which the MS-DIAL software showed an alert "Chromatogram similar" and removed the features with lower m/z values. Those 338 339 features are likely in-source fragments, because their peak shapes were similar to the peak shape of the molecular ion and the m/z value corresponded mainly to the loss of CH₃ or CO. 340

341 MS-DIAL has been shown to enable the deconvolution of DIA MS/MS spectra for compounds that co-342 elute to some extent.⁴⁵ However, the precursors have to have different exact masses and for an efficient deconvolution, there has to be at least two data-point difference between the maxima of the 343 chromatographic peaks.⁴⁶ Recent advancements such as CorrDec⁴⁶ (which has been added to MS-DIAL 344 345 version 3.22 and up) have been shown to enable the deconvolution of even completely co-eluting 346 compounds. However, this approach requires that the analysis of the sample would be repeated at least ten times, which would make the off-line 2D LC analysis of one sample dreadfully long. Also, for the 347 348 time being, there is no evidence that it would be able to deconvolute isomers, which signifies that powerful chromatographic separation is still needed before the MS detection. 349

350

351 3.4 Classification of the detected lignin compounds

352 All of the 120 data files (in .ABF format) obtained from the LC×SFC-HRMS/MS measurement were 353 loaded to MS-DIAL and analysed with the parameters described in section 2.4. After combining the results, 471 pseudo-molecular ions corresponding to a $C_x H_y O_z$ formula with DBE ≥ 4 were detected in 354 the depolymerised lignin sample (Table S3 in the SI). DBE (Double Bond Equivalent, also Ring Double 355 356 Bond Equivalent aka RDBE or RDB is sometimes used for the naming) is a value that can be used to classify detected compounds, including lignin depolymerisation products. Depending on the 357 experimental conditions of the depolymerisation and on other additional sample pre-treatment 358 processes, such as fractionation, the lignin sample can contain monomers (analytes with one aromatic 359 core), dimers (two aromatic cores), trimers (three aromatic cores), and so on. Looking at the structure 360 361 of lignin in Figure 1, the DBE value for monomers should generally stay in the range of 4-7, for dimers in the range of 8-11, for trimers 12-15, and so forth. As the MS-DIAL software yielded exact masses 362 for all of the features, it was possible to find the molecular formula and, from that, the DBE value. For 363 364 the analysed sample, the three most retained compounds in the SFC dimension also had the highest DBE value (17, generally corresponding to tetramers). After those compounds, there was no UV signal, 365 confirming that the sample did not contain oligomers higher than tetramers. 366

Based on the DBE value, the detected features were plotted on an LC×SFC plot (Figure 4) with the same retention times as was seen in Figure 2. As hypothesised, the detected features are clustered together based on their DBE value corresponding possibly to a mono-, di-, tri-, or tetramer. This phenomenon can again be explained by the π - π interactions between the depolymerised lignin aromatic ring(s) and the anthracene moiety of the 1-AA stationary phase. This kind of classification can be used to detect outliers for further investigation. In Figure 4, the compounds that are likely not lignin compounds are marked with crossed-out squares, as their structural candidates and compound classes in SIRIUS were 374 far from potential lignin compounds (e.g., aliphatic compounds, terpenoids). This classification can also

help with comparing samples to each other without the need for a detailed structural study. This kind of

visual comparison based on grouping on 2D plots is a very common approach in 2D GC but much less
 explored in 2D LC.⁴



378

379Figure 4. LC×SFC-HRMS plot (MS1) of $C_xH_yO_z$ compounds (DBE \geq 4) detected with MS-DIAL in the380depolymerised lignin sample. The same data that was used in Figure 2 is also presented here. The ovals with dashed381lines represent the clusters of lignin compounds with DBE 4-7 (blue dots, likely monomers), 8-11 (purple triangles,382likely dimers), 12-15 (green diamonds, likely trimers), and 16-19 (black dots, likely tetramers). The outliers that383are presumably not lignin compounds are presented with crossed-out squares.

384 At the same time, one must be careful, as there can also be lignin compounds that have a DBE value corresponding to a higher class of the presented DBE ranges. For example, as was shown in the SI of a 385 publication by Prothmann et al.⁵, additional double bonds in the structure of a dimer can yield a DBE 386 387 value that classically corresponds to a trimer. Therefore, for the sample analysed in our work, we studied the potential structural candidates proposed by the SIRIUS software based on the comparison of MS/MS 388 pattern to see if the candidates belong to the class implied by the DBE value or not (Table S4 in the SI). 389 390 This was merely done to see if the candidates matched mainly mono-, di-, tri-, or tetramers, not to tentatively identify all the structures of the detected compounds, as this is not the aim of this work. In 391 392 the case of compounds with a DBE value of 4-7, 185 compounds had one aromatic ring, 9 corresponded more to unsaturated aliphatic compounds, and 3 had candidates matching to a similar extent to 393 394 compounds both having and not having an aromatic ring. With DBE value of 8-11, there were 202 compounds whose candidates all matched dimers and 1 that matched with monomers. With DBE range 395 396 12-15, 24 compounds matched largely trimers, 8 had candidates mostly corresponding to dimers, and 397 13 had both dimers and trimers as equally potential matches. For DBE 16-19, 1 compound matched 398 tetramers and 1 compound could be either trimer or tetramer. Therefore, under the classical DBE ranges, 399 94% had indeed highest matches with monomers, almost 100% with dimers, 53% with trimers, and one out of two to tetramers. This suggests that some of the compounds classified by the DBE value could be 400 401 indeed smaller by one aromatic ring. To determine how much misclassification using DBE value can cause, it would be necessary to analyse oligomer standards (which are scarce, as mentioned before) or 402 403 have a good match in the SIRIUS software.

404 The SIRIUS software uses structural fingerprints that have been predicted from the structures of potential candidates found in chemical databases. For this, the corresponding structure has to be present 405 in one of the databases (such as PubChem, COCONUT) utilised by the software. In the case of the 406 407 detected compounds, over 95% had the first match with a compound that was present also in the 408 PubChem database. Therefore, to get an idea how well the PubChem database covers lignin compounds, we searched for the lignin oligomers tentatively identified in the study by Prothmann et al.⁵ As can be 409 seen in Table S5 in the SI, out of the 35 compounds, only one had an exact stereo isotope match in 410 PubChem. For 12 compounds, there were no isomers matching at least with 90% of structural similarity. 411 These included all those dimers that had a DBE value classically corresponding to trimers. This 412 demonstrates, that the databases contain only a small part of the potential structures, as lignin oligomers 413 414 with all of the potential structures caused by the isolation and depolymerisation are quite understudied 415 compounds. However, some oligomers had up to 69 isomers present in the PubChem database, which allows for some compounds to have a match at least with a structurally similar structure. In addition, for 416 417 a lot of the potential tri- and tetramers and for some dimers detected in our study, the match factor in 418 SIRIUS was quite low (around 50% or less). Therefore, for more reliable structural characterisation of lignin compounds, specific lignin databases, further fragmentation studies, or manual elucidation of the 419 420 MS/MS spectra would be necessary. However, applying the SIRIUS software still enabled us to demonstrate the benefits of using the 2D chromatographic method for the analysis of lignin before 421 422 MS/MS, which was the aim of our study. In addition, the classification based on DBE value can still 423 help to determine the possible class of monomer/oligomer, detect outliers for further investigation, and compare samples at large. 424

425

426 3.5 Investigation of the separation mechanism

427 Although the analysis of the depolymerised lignin sample demonstrated the classification of lignin compounds based on their DBE values on the 2D plot (Fig. 4), the analysis of monomeric standards aids 428 to study the separation mechanisms more in-depth. Therefore, the same 33 monomer standards that were 429 used for column screening were analysed with the optimised LC and SFC methods. In Figure 5, the 430 431 placements of the monomer standards on the 2D LC×SFC-HRMS plot are presented (the names of compounds are shown in section 2.1 and Table S1). By studying the retention of similar standards 31 432 433 and 33, it can be seen that an additional double bond in the structure increases the retention in the SFC dimension. Comparison of the retention of standards 4 and 8, which differ only in the position of the 434 435 double bond, demonstrates that a higher number of conjugated double bonds increases retention with 436 the 1-AA column. Once again, this is caused by the π - π interactions, which are stronger in the case of larger conjugated structures.47 437



Figure 5. 2D LC×SFC-HRMS plot of the monomer standards. The plot was constructed by combining the 1D LC
and 1D SFC retention times of the standards. The names of the compounds corresponding to the numbering are
shown in section 2.1 and Table S1. Dashed blue lines separate roughly the sections based on the number of
hydroxyl groups in the monomer structure.

443 Another mechanism that plays a major role in the separation is the hydrogen bonding interaction. As 444 can be seen by the vertical dashed blue lines in Figure 5, in the case of the analysed standards, the SFC dimension can be roughly sectioned based on the number of hydroxyl groups in the structure of the 445 446 monomers. The more hydroxyl groups are in the structure of the compound, the stronger the hydrogen 447 bonding interaction with the 1-AA polar sites, which in turn leads to increased retention. For example, standard 32 (3 –OH) has a higher retention time than 25 (2 –OH), but 25 has higher retention than 16 (1 448 449 -OH). The same behaviour can also be seen for more complex monomers, such as 29 (2 -OH) and 23 (1 –OH). However, this polar interaction can be sterically hindered by other functional groups present 450 451 in the structure of the compound. For example, standard 6 eluted earlier in the SFC dimension than its 452 positional isomer 10 because, in the structure of 6, both methyl groups are next to the hydroxyl group, 453 weakening the polar interaction. Retention of standards 25 and 28 demonstrates the same effect even for compounds that have just -OH functional groups. The steric effect on SFC retention behaviour can also 454 be observed for non-isomeric standards, such as 9 and 16, 29 and 30. Although we presume that the 455 same interactions affect the separation of oligomers, without standards, we cannot propose a sectioning 456 457 for oligomers.

458 The utilisation of the RPLC dimension in ¹D enables additional separation based on hydrophobicity. 459 This can be seen, for example, when studying the $\log P$ (octanol-water partition coefficient) values and retention of standard 14 compared to 13 and 15 in the direction of the LC axis. Based on the publication 460 by Smith et al.⁴⁸, for standard 14, a logP value of 2.50 has been found, which is in correspondence with 461 the higher retention in LC compared to standards 13 and 15, with both having a logP value of 1.97. 462 463 Moreover, the F5 (pentafluorophenyl propyl) phase is known for its combination of hydrophobic, aromatic, and steric separation mechanisms which also contributed to the improved selectivity of 464 isomeric species such as monomers 4 and 8. Therefore, the developed 2D LC×SFC method enables the 465 separation of compounds based on hydrophobicity, the number of hydroxyl groups, steric effects, 466 position and number of double bonds. Having this kind of various interactions can be especially 467 beneficial for the (improved) separation of positional isomers. 468

469

470 3.6 Elucidation of the detected compounds in the depolymerised lignin sample

471 The most straightforward way to determine whether a compound is present in the depolymerised lignin sample is to use reference standards, such as the same 33 standard compounds selected based on 472 previous studies. Thanks to the multi-dimensional LC×SFC-HRMS/MS method, the elucidation of 473 compounds can be made based on four criteria - retention times in RPLC and SFC, accurate mass, and 474 fragmentation pattern. As has been proposed by Schymanski et al.⁴⁹, this yields a confidence level of 1, 475 and as the authors say, the application of an orthogonal method (as we have done here by applying both 476 LC and SFC) confirms this confidence level. For determining the t_R reproducibility of the SFC 477 478 dimension, Mix A containing monomer standards nr 4, 5, 11, 16, 20, and 28 was analysed during three days, each with a repetition of five. Using the EIC signal of each molecular ion, a within-lab 479 480 reproducibility value of 0.012 min was calculated (3-fold the mean of t_R standard deviations). Because of the fraction collection, one sampling time was selected as the reproducibility of the ¹D RPLC 481 dimension. Therefore, the following criteria were applied: a) t_R in RPLC (± 0.085 min); b) t_R in SFC 482 $(\pm 0.012 \text{ min})$; c) accurate mass of precursor $(\pm 3 \text{ ppm})$; and d) MS² match over 90% in SIRIUS. 483 484 Interestingly, only two of the 33 standards (19: acetosyringone and 22: 4-hydroxyacetophenone) were identified within the lignin sample, matching all criteria (overlay can be seen in Figure 6). No other 485 standard matched even the first three criteria. This demonstrates that because of the complexity of a 486 487 natural depolymerised sample, it is very difficult to obtain corresponding standards for identification without performing some preliminary structural characterisation. 488

489 In the interest of obtaining more information about the detected compounds in the depolymerised lignin 490 sample, SIRIUS software was used. In addition to the software provided match scores with potential candidates, knowing also the retention mechanisms in the two dimensions aids to give additional 491 492 assessment for the proposed candidates. As hydrophobicity is the driving force for separation in the 493 RPLC dimension, the log P value of the candidate has to be reasonable in relation to the t_{R} . In the SFC 494 dimension, when using the 1-AA stationary phase, the number and position of hydroxyl groups have an effect on the retention, which can aid with the structural characterisation of similar, or even isomeric, 495 compounds. Overall, these aspects can help evaluate the suggested candidates and propose some 496 497 tentative structures. Therefore, in Figure 6, the tentative structures for some of the monomers and dimers detected in the depolymerised lignin sample are proposed. 498

499 In the case of monomeric compounds, it was easier to find correlations and exclude illogical candidates 500 because of their simpler structure. A similar rough sectioning based on the number of hydroxyl groups 501 that was seen with standards was also seen with the monomeric compounds (black dashed lines in Figure 6). As there are no compounds in the area of none or three –OH groups, we can presume that all 502 503 monomers had at least one or two hydroxyl group(s). Compared to the monomeric standards, the 504 monomers in the real-life sample (blue dots in Figure 6) had generally higher retention in the RPLC 505 dimension, which suggests that those compounds are more hydrophobic. These two observations were 506 confirmed by studying their possible structures with the SIRIUS software. For example, as seen in Figure 6, the possible structures of compounds A, B, F, and I all have more nonpolar side chains that 507 lead to higher hydrophobicity, which in turn leads to higher retention in RPLC. This can aid with the 508 509 separation of isomers, as can be seen with compound G, which has the same formula as standard 23 510 $(C_{10}H_{10}O_3)$. These compounds showed similar retention in SFC but good separation in RPLC. In the SFC dimension, isomers K and O had highly similar fragmentation patterns, leading to the suggestion 511 of the same around 10 positional isomers for both compounds with a SIRIUS match factor over 80%. 512 513 However, studying the position on the 2D plot suggests that these compounds have similar logP values but different hindrances of the -OH groups. Using these characteristics, we propose tentative structures 514 515 for the two compounds, where the -OH groups are more hindered in compound K and less in compound 516 O. In terms of logP value, for the presented compounds only N has a very low value. This again suggest 517 that the real structure of the detected compound is absent from the used databases.



518

519 Figure 6. LC×SFC-HRMS plot of monomer standards (red diamonds with numbers) and some of the compounds 520 detected in the depolymerised lignin sample: all compounds having DBE 4-7 (blue dots) and some of the 521 compounds having DBE 8-11 (purple triangles). For monomer standards, the retention data was obtained from 1D 522 LC and 1D SFC analyses and combined into a 2D plot. For the selected lignin compounds, the retention times are 523 the same as in Figures 2 and 4. The dashed black lines indicate the rough sectioning for monomeric compounds 524 based on the number of hydroxyl groups. The monomers that could be identified in the real-world sample by using 525 corresponding standards are highlighted with purple ovals. Black rectangles and letters A to Y highlight some 526 unknowns for which we propose one of the possible structures that had a SIRIUS match over 80%, reasonable 527 computed logP value and number/position of hydroxyl groups. The logP values were obtained from the SIRIUS 528 software and correspond to the XLogP values calculated using the Chemical Development Kit CDK. The letters 529 of the compounds correspond to the following ID numbers shown in Table S3: A - ID 279; B - ID 256; C - ID 60; D – ID 30; E – ID 25; F – ID 345; G – ID 77; H – ID 117; I – ID 437; J – ID 11; K – ID 6; L – ID 59; M – ID 530 14; N – ID 324; O – ID 9; P – ID 346; Q – ID 270; R – ID 108; S – ID 148; T – ID 166; U – ID 280; V – ID 66; 531 532 W – ID 47; X – ID 39; Y – ID 28.

For dimers and higher oligomers, the interpretation of elution order is more complex as there is an interplay of the interaction factors, none of which is largely dominating. As those compounds have more aromatic rings than monomers, the elution in the SFC dimension is shifted to higher retention times (as can be seen by the classifications in Figure 4). The higher number of double bonds also leads to a higher

- 537 probability of having longer conjugated systems in addition to less straightforwardly interpretable steric
- 538 effects, meaning that the –OH zones were not as clear. The absence of oligomer structures from
- 539 databases also amplifies the complexity. However, the same ordering of compounds based on interaction
- 540 mechanisms that were seen for monomeric compounds was also seen for some of the possible dimers.541 Figure 6 shows some examples of tentative dimer structural elucidation. Compound U had higher
- retention in the RPLC dimension than compound T, presumably because of the longer alkane chain.
- 543 Compound P is a similar compound to T and U, but because of the lower retention in the SFC dimension,
- 544 we presume that the positions of the two –OH groups have to be located so that there are more steric
- 545 effects impeding the polar interactions. In the structure of compound P, probably the positions of the –
- 546 OH groups are located so that there is even more hindrance; however, for this compound, there were
- 547 only a few isomers available in the databases used by the SIRIUS software.

The structures of the tentatively annotated monomers and dimers have quite unusual structures containing saturated side chains and linkages. However, the sample analysed in this work was obtained from the partial depolymerisation of lignin that was performed under hydrogen atmosphere, which can cause reduction of double bonds. Of course, to confirm these conclusions about the structures of potential dimers, again standards or databases including more lignin compounds would be needed.

553 Overall, involving an annotation software in the data analysis helped to elucidate the structures of 554 unknown compounds, which in turn demonstrated the usefulness of the 2D chromatographic separation 555 method for the non-target analysis of complex mixtures. Besides powerful separation, the combined 556 LC×SFC-HRMS/MS method also helps to reduce the number of candidates for each feature by 557 incorporating the logic of the retention mechanisms.

558

559 3.7 Comparison of the 2D LC×SFC method to 1D SFC

The developed LC×SFC method was compared to a long (gradient time 30 min) 1D SFC separation of the same depolymerised lignin sample. For the 1D method, SFC was selected instead of RPLC to have the same ionisation conditions as the 2D method, thus ensuring a fair comparison independent of ionisation (in some cases, SFC has contributed to an improved ionisation).¹² As discussed before, the corrected peak capacity of the LC×SFC method was 1995. For the 1D SFC separation of the depolymerised lignin sample, a much lower value – 155 – was found for the peak capacity. Therefore, by using the 2D setup, more than 12-fold higher peak capacity could be obtained for this sample.

567 3.7.1 Separation of isomers

In addition to miss-annotations caused by unwanted in-source fragmentation, the poor chromatographic 568 separation of isomers can also lead to false annotations.⁴⁴ Besides observing a decrease in co-elutions 569 for compounds with different accurate masses, isomers also had better separation in 2D. This can be 570 especially beneficial for the analysis of depolymerised lignin, as out of the detected $C_x H_y O_z$ compounds 571 with $DBE \ge 4$, almost 77% had at least one isomer (361 features out of 471) detected in the same sample 572 573 (Table S3 in the SI). For example, for deprotonated $C_{18}H_{20}O_5$, there were even 12 isomers detected in the sample. In terms of discriminating isomers, one of the following criteria has to be fulfilled. The 574 straightforward case is when the retention times of the isomers are sufficiently different, thus giving 575 MS² spectra corresponding only to one of the compounds.¹⁸ However, when the isomers co-elute, the 576 MS² spectra will have a mixture of product ions originating from two compounds. In that case, 577 researchers have demonstrated that the co-eluting compounds can be differentiated when i) they have 578 characteristic fragmentation or *ii*) corresponding standards can be used to elucidate their mass 579 spectrometric fragmentation pathways.^{50–53} If one of these criteria is not met, then not even highly 580 powerful data analysis tools can currently aid with the deconvolution.⁵¹ In the case of target analysis 581 with standards, it is possible to use on-line LC×LC with heart-cutting mode allowing the known co-582

elutions in ¹D to be separated with a shallower gradient in the ²D.⁵³ However, multiple heart-cutting mode is technically limited in on-line configuration and so the detection of co-eluting isomers is especially complex in the case of non-target analysis as it is impossible to detect (or even know) coelution of isomers when there is no evidence to suspect their presence in the 1D separation. Comprehensive 2D chromatography analysis involving a second dimension with high isomer resolution requires a shallow ²D gradient that so far only off-line configuration can provide.

589 Although, in some cases, SFC has shown to have a more efficient separation of isomers than RPLC,⁵⁴ in our study, we found that both LC and SFC dimensions are necessary for the analysis of depolymerised 590 lignin. For example, in Figure 7, when extracting the m/z value of 341.10263, only two major peaks are 591 seen on the 1D chromatogram, whereas the LC×SFC plot has four major peaks. As can be seen by 592 593 looking at the parallel lines on the EIC of the 2D plot in Figure 7, in the case of 1D analysis, there would 594 be co-elution of these isomers, regardless of whether RPLC or SFC would be used. Using MS-DIAL for the 1D-SFC data also detected the same two peaks as two spots because the software spots precursor 595 596 ions peaks by monitoring two continuous data axes: retention time (t_R) and accurate mass (m/z).¹⁶ However, applying the developed 2D LC×SFC method, it was possible to detect six isomers for this 597 598 formula. This included a compound with a much lower intensity (ID 49) compared to its isomers that 599 would have co-elution when only the SFC dimension would be used (ID 313 and 132). Therefore, using 600 the 2D separation method yields MS data that corresponds to the separated isomer (and not a 601 combination of ions from the co-elution) and also enables the detection of much less intense isomers.



603*Figure 7.* Comparison of 1D SFC-HRMS (top row) to 2D LC×SFC-HRMS (bottom row) based on the separation604of isomers. A value of 341.10263 m/z (± 5 ppm) was used to construct the EICs, which corresponds to deprotonated605 $C_{19}H_{18}O_6$ and DBE of 11. The ID numbers of detected isomers (312, 131, 336, 313, 132, and 49) correspond to606the numbering presented in Table S3 in the SI. The BPC of the 1D SFC analysis is shown in Figure S2 in the SI.

607

608 3.8 FBMN – Feature-Based Molecular Network

609 As the final step, Molecular Network (MN) was applied. MN connects together features that have similar fragmentation; thus, we can obtain more information about their structural similarities. For LC×SFC 610 data, MN has been used by Wei et al.²⁴, where precursor ions within a defined mass tolerance range and 611 nearly identical MS² spectra were merged into a single node. This was beneficial for the removal of 612 613 features that are caused by the collection of the same analyte into consecutive fractions. However, MN would also fuse together those isomers with similar MS^2 that have *i*) different retention time in ²D or *ii*) 614 the same retention time in ²D but baseline separation in ¹D (features in non-consecutive fractions). This 615 issue can be overcome by using FBMN (a type of MN), which enables the visualisation of features with 616 the same accurate mass by also including MS^1 information, such as t_R^{32} Such an approach can be 617 especially beneficial for the analysis of depolymerised lignin, as the sample analysed in our study 618 619 contained a very high number (approx. 77%) of isomers.

In Figure 8, the FBMN for the depolymerised lignin sample analysed with the 2D LC×SFC-HRMS/MS 620 method is presented. With the applied generic GNPS parameters, 318 compounds out of the 471 were 621 622 connected in the main network (shown in Figure 8), and the other compounds were in clusters where 623 there were less than five nodes. In orange are highlighted all features corresponding to deprotonated $C_9H_{10}O_4$, which were noted with O (ID 9), K (ID 6), and C (ID 60) in Figure 6. It was seen that feature 624 625 9 is directly connected to feature 6 (red dashed line), which supports the proposition that these 626 compounds are positional isomers, as was discussed in section 3.6. Although compound 60 (noted as C 627 in Figure 6) also has the same formula as the previous two compounds, it is connected to feature 6 628 through another non-isomer feature. This is consistent with the structural candidates as feature 60 seems 629 to have different side groups and is probably not a positional isomer to 9 and 6.



Figure 8. Feature-Based Molecular Network (FBMN) of the depolymerised lignin sample analysed with the LC×SFC-HRMS/MS technique, and visualised in Cytoscape. All the detected features corresponding to deprotonated $C_9H_{10}O_4$ and $C_{19}H_{18}O_6$ are shown in orange and pink, respectively. All the edges showing all connections for features with ID 9, 6, 60, 49, and 313 are highlighted with red dashed lines. For the compounds highlighted with orange, the tentative structural candidates are presented, where the number corresponds to the feature ID (Table S3 in SI) and the letter to the notation used in Figure 6.

- 637 Applying the same argumentation, we can also study the location of other isomers, for example, isomers
- 638 corresponding to deprotonated $C_{19}H_{18}O_6$, which was also the example in Figure 7. In Figure 8, all 639 isomers matching this formula are highlighted with pink colour. As can be seen with the red dashed
- 640 lines, 313 is directly connected to four of the isomers, demonstrating that five out of six isomers have
- similar MS^2 patterns. This suggests that all except compound 49 are highly similar, possibly positional,
- isomers. Therefore, FBMN has demonstrated to rapidly define and visualise if the isomers are
- 643 structurally highly similar (including positional isomers) or more different from each other.
- 644

645 4. Conclusions

- 646 In this work, a powerful comprehensive off-line 2D RPLC×SFC-HRMS/MS method was applied for 647 the non-target analysis of depolymerised lignin. The method enabled the detection of 471 $C_xH_yO_z$ 648 compounds with DBE \geq 4, where the highest DBE value was 17 (classically corresponding to tetramers). 649 In addition, the 2D plot showed a classification of the lignin compounds based on their DBE range 650 largely corresponding to the number of aromatic rings in the structure. This kind of classification can be 651 used to find outliers (as was demonstrated here) or to compare different samples to each other.
- 652 The analysis of 33 monomeric standards enabled to investigate the 2D separation mechanism in more detail. It was seen that the 2D LC×SFC separation was based on hydrophobicity, number of hydroxyl 653 groups, steric effects, and position/number of double bonds in the structure of the analyte. Understanding 654 655 the separation mechanism helped to characterise the LC×SFC-HRMS/MS results of the depolymerised lignin and evaluate the structural candidates proposed by the SIRIUS software. In addition, the 2D 656 approach yielded clean MS¹ and MS² spectra that could be more easily analysed with mass spectral 657 analysis softwares (in this study, MS-DIAL, SIRIUS, and FBMN). However, it was seen that there is a 658 need for additional developments to improve the structural characterisation of lignin compounds with 659 660 annotation softwares.
- 661 Compared to a long 1D SFC method, the 2D technique provided an improved separation of compounds, including isomers. In terms of lignin analysis, this is highly beneficial, as 77% of the detected features 662 had at least one corresponding isomer detected in the same sample. The FBMN additionally helped to 663 study the possible structural candidates of the isomers based on their MS² spectral similarities. The 664 established strategy could also suit the (non-target) analysis of other isomer-rich mixtures with neutral 665 compounds. Therefore, we have demonstrated that powerful chromatographic methods are needed (such 666 667 as the one applied here) for a more reliable identification based on mass spectral data. In relation to isomers, this could be especially beneficial as the annotation of co-eluting isomers is still an unsolved 668 669 challenge.
- 670

671 Acknowledgments

This work was funded by the French National Research Agency (project BIOPOLIOL, ANR-21-CE430026). The authors would like to thank Dr. Pilleriin Peets and Ph.D. candidate Helen Sepman for fruitful
discussions about the data analysis involving MS-DIAL and SIRIUS softwares. The anonymous
reviewers are also acknowledged for their constructive comments and help in improving the manuscript.

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