

Abstract

The main aim of this work was to develop an untargeted normal phase LC-MS method, starting from a targeted method already validated for the analysis of 135 polar metabolites. Since the LC instrument and column were the same, most of the chromatographic conditions remained identical, while the adaptations focused on maintaining the ionic strength of the eluents constant. The sample preparation was simplified and the effectiveness of LC-MS for long batches was evaluated, in order to record the maximum number of metabolites with good chromatographic resolution and 28 the best MS stability and accuracy. The method was applied to study the influence of storage conditions on wine composition. Slightly sub-optimum storage conditions had a major impact on the polar metabolite fingerprint of the red wines analysed and the markers revealed included phenolics, vitamins and metabolites indentified in wine for the first time (4-amino-heptanedioic acid and its ethyl ester).

Keywords: holistic, wine metabolomics; wine conservation; method development; primary metabolites; metabolomics; normal phase LC; QTof MS; HILIC, *Vitis vinifera*.

1. Introduction

Metabolomics, or metabolic fingerprinting, is used for comprehensive characterisation of molecules in the biological system investigated. In contrast to targeted methods, where the analyte(s) of interest is well known and the scope very specific, in untargeted metabolomics the aim is to achieve the widest possible metabolic coverage in an unsupervised manner. The idea has found application in life, environmental, food and other sciences (Baker, 2011; Gika, Theodoridis, Plumb, & Wilson, 2014; Gika, Wilson, & Theodoridis, 2014; Nicholson & Lindon, 2008). Although the technique has been known since the 1960s (Dalgliesh, Horning, Horning, Knox, & Yarger, 1966), major evolution started in around 2000 and since then the number of publications and active researchers in the field of metabolomics has increased rapidly (Gika, Wilson, et al., 2014). Because of the high cost and specific expertise in different fields needed, the first publications in food science appeared later (Cubero-Leon, Peñalver, & Maquet, 2014; Oms-Oliu, Odriozola-Serrano, & Martín-Belloso, 2013). Oenology and viticulture were among the first sectors in food science to embark on metabolomics studies (Arapitsas et al., 2012; Arapitsas, Speri, Angeli, Perenzoni, & Mattivi, 2014; Castro, Martins, Teixeira, & Silva Ferreira, 2014; Gougeon et al., 2009; Theodoridis et al., 2011).

Since targeted methods have been widely used and taught in universities courses of analytical chemistry for many decades, their applications to food chemistry, biology or medicine are very advanced and the knowledge and expertise for method development is well established in the corresponding industries and regulatory bodies. Untargeted techniques are relatively new, and so there is still debate about experimental design and method validation (among other things). The development of a valid holistic LC-MS method is one of the most critical steps in a metabolomics project, because not only the detection of as many metabolites as possible is required, but also high

instrumental stability and repeatability during analysis, in order to facilitate chromatographic alignment, the accurate definition of metabolic space and marker discovery with as few false negatives/positives as possible. Researchers are currently developing their methods based on the experience obtained in the targeted analysis field. Most efforts are directed at 1) improving metabolite detection and identification, mainly taking advantage of recent developments in mass spectrometry technology (Dunn & Hankemeier, 2013; Holčapek, Jirásko, & Lísa, 2012); and 2) data analysis, to look through massive datasets trying to unravel biochemical phenomena and identify trends in complex data. Metabolomics datasets are massive (especially those generated by LC-MS) and can be an attractive asset for chemometricians, programmers, and statisticians (Dunn & Hankemeier, 2013; Gika, Wilson, et al., 2014). This is expected to grow further with the increased availability of data (and metadata) open repositories (Franceschi et al., 2014). Finally the sample preparation methods are in most cases as simple as possible, to avoid the introduction of bias due to the different extraction efficiency observed for different metabolites for example (Mattivi et al., 2012; Noack & Wiechert, 2014; Theodoridis et al., 2011; Wu, Southam, Hines, & Viant, 2008).

Hydrophilic interaction chromatography (HILIC) has recently appeared to be the best LC approach for complementing reverse phase (RP) chromatography in global (untargeted) metabolomics fingerprinting. Because of its different selectivity, HILIC offers better retention for polar metabolites and due to its mechanism it provides better sensitivity (Gika, Theodoridis, et al., 2014; Gika, Theodoridis, Vrhovsek, & Mattivi, 2012; Spagou et al., 2011; T'kindt, Storme, Deforce, & Van Bocxlaer, 2008; Theodoridis et al., 2011). We can divide the published applications of HILIC into two main categories: a) targeted methods focusing on one group of metabolites (Valls, Millán, Martí, Borràs, & Arola, 2009; Vilhena et al., 2014; Willemse, Stander, & de Villiers, 2013; Zhu et al., 2014) and b) untargeted methods which follow a holistic approach (Spagou et al., 2011;

T'kindt et al., 2008; Theodoridis et al., 2011). Our group (Gika et al., 2012) recently developed a targeted HILIC-MS/MS method which covers a wide set (135) of primary and secondary polar metabolites belonging to various molecular classes such as sugars, sugar alcohols, organic acids, bio-amines, amino acids, etc, which play an important role in food and plant chemistry.

Wine can be stored long time and in contrast to most food, ageing is positively correlated with quality. Cheap wines are usually consumed within a short time, while premium quality wines are expected to last and even improve with age, and are frequently stored for up to several years. However, both products should be stored in ideal conditions to allow consumers to experience equal or better quality as compared to the legal requirements and winemakers' standards when the wine leaves the winery. From the winery to the consumer many factors can influence wine quality and nutritional value, especially storage conditions and duration. Optimum storage conditions reduce the risk of deterioration in wine quality, gain customers' confidence and sharpen the competitive edge in the market. Humidity, temperature, light and packaging have the most direct impact on wine quality and nutritional value, so there are various studies in the literature dealing with metabolic changes caused in wine by incorrect and sub-optimal conservation conditions (Arapitsas et al., 2014; Ghidossi et al., 2012; González Marco & Ancín Azpilicueta, 2006; Hernanz et al., 2009; Hopfer, Ebeler, & Heymann, 110 2012; Loscos, Hernández-Orte, Cacho, & Ferreira, 2010; Monagas, Bartolomé, &

111 Gómez-Cordovés, 2005; Wirth et al., 2010).

First aim of this work was to adapt the above described targeted method and to optimise it to a holistic LC-MS metabolic profiling method. The final goal was to apply the optimized metabolic profiling method to the study of a common oenological problem,

namely the effect of typical domestic storage conditions as compared to optimum cellar 116 conditions for five red wines and for a period of 24 months.

2. Material and Methods

2.1. Chemicals

All chemicals used in this study were of the highest purity grade available and purchased from FLUKA Sigma-Aldrich, unless otherwise stated. Water purified with a Milli-Q Water Purification System was used for chromatography and preparation of standard solutions.

2.2. Wines

During 2009 five *Vitis vinifera* L. cv. Sangiovese grape samples from different areas of Montalcino (Tuscany - Italy) were collected, in order to cover the whole production area of Brunello di Montalcino. From each selected vineyard, a total of c. 80 128 kg of grapes was sampled in 20 kg boxes and sent via refrigerated transport (4 $^{\circ}$ C) to the experimental winery at the Edmund Mach Foundation (Trentino - Italy) on the same day. The grapes from each zone were vinified separately and after malolactic fermentation (March 2010) the young wine samples were filtered and bottled in 375 mL dark glass bottles (~20 bottles for each wine). Further details and basic oenological parameters and analysis can be found in Arapitsas et al. (2014).

2.3. Storage

After bottling, which was considered as time zero in the experimental design, two 136 bottles from each wine was stored at 4 $^{\circ}$ C (time zero or reference samples). The rest of the bottles of each wine were divided into two groups and stored in two different conditions: (i) One half was stored in such a way as to mimic typical home/domestic wine conservation, with variable conditions during the year, with medium temperature 140 around 20-22 °C (only few summer days temperature arrived at 26-27 °C), in a room

with no light but without temperature or humidity control (domestic) and (ii) the other set 142 was stored in a cellar where the temperature (15-17 $^{\circ}$ C) and the humidity (~70%) were controlled, stable and optimum for red wine conservation (cellar). For both conditions, wine bottles were stored in horizontal position inside typical cardboard wine boxes. Every 6 months two bottles of each wine (two from the domestic and two from the 146 optimum conservation conditions) were sampled and brought to 4 $^{\circ}$ C. The final storage time was 24 months after time zero, which was the bottling date. All samples were analysed together at the end of the experiment.

2.4. Sample preparation

150 On termination of the experiment the samples were kept for two months at 4 $^{\circ}$ C until analysis. Wines were uncorked under nitrogen atmosphere and an aliquot was transferred into a 15 mL amber vial (filled to capacity). Then, again under nitrogen atmosphere, a quality control (QC) pooled sample was prepared by combining 0.5 mL of each sample.

For the dilution test, the QC sample was diluted 1:1, 1:2, 1:4, 1:6 and 1:9 v/v with acetonitrile (ACN). In the finally adapted protocol, 1 mL of each wine sample was diluted with 2 mL ACN (1:2 dilution) and then 40 μL of the internal standard mix was added. 158 Finally 2 mL from each sample/QC was filtered through 0.2 μ m PTFE filters into a 2 mL autosampler amber vial (MS certified) for LC/MS analysis. The internal standard mix 160 contained 14 mg of xanthosine and 25 mg of nicotinic acid in 10 mL of MeOH:H₂O (1:1). For blank samples the same procedure was followed but instead of wine, 1 mL of Milli-Q water was used.

2.5. UPLC-QTOF MS analysis

A Waters Acquity UPLC coupled via an electrospray ionization (ESI) interface to a Synapt HDMS QTOF MS (Waters, Manchester, UK) operating in W-mode and controlled by MassLynx 4.1 was used. All samples were analysed with a 2.1 mm × 150

167 mm ACQUITY UPLC 1.7 µm BEH amide column (equipped with an ACQUITY UPLC BEH Amide 1.7 μm VanGuard Pre-column) which was maintained at 60 °C and eluted with a multistep gradient over the course of 30 min at 400 μL/min. The gradient started with a 4 min isocratic step at 100% A (acetonitrile–water, 95–5 (v/v), 20 mM ammonium formate), then rising to 28% B (acetonitrile–water, 2–98 (v/v), 20 mM ammonium formate) over the next 21 min and finally to 60% B over 5 min. Then the flow rate was decreased to 250 μL/min in an isocratic step for 0.5 min; after that B was increased to 80% and was kept isocratic for 2 min and finally the column was returned to the initial conditions for a 12 min equilibration. Two cycles of weak and strong solvent washing of the injecting system were carried out between injections. The injection volume was 10 μ L and the samples were kept at 4 °C throughout the analysis. Mass spectrometric data were collected in positive ESI mode over a mass range of 30 to 1000 amu, with scan duration of 0.3 s in centroid mode. The transfer collision energy and trap collision energy were set at 6 V and 4 V. The source parameters were set as follows: capillary 3 kV, sampling cone 25 V, extraction cone 3V, source temperature 150 ºC, desolvation temperature 500 ºC, desolvation gas flow 1000 L/h and nebulizer gas 50 L/h. External calibration of the instrument was performed at the beginning of each batch of analysis. LockMass calibration was applied using a solution of leucine enkephaline (0.5 mg/L, *m/z* 556.2771 for positive ion mode) at 0.1 mL/min.

2.5.1. Dilution test

In order to find the optimum sample dilution 20 injections of each QC dilution were performed, starting with the most diluted sample. Between each dilution set, a blank sample was injected.

2.5.2. MS QTof stability test

Before running the real samples and in order to evaluate LC-MS stability in practical conditions, 50 injections of the QC samples were analysed, with one blank sample injection between every 10 QC injections.

2.5.3. Sample set

The sample set was made up of 5 biological replicates/time points/conditions; specifically, 5 bottles for time zero (reference), 5+5 bottles for the 6 months time point, 5+5 bottles for 12 months, 5+5 bottles for 18 months, and 5+5 bottles for 24 months (5 *domestic* and 5 *cellar*). So in total the sample set included 45 bottles of wine, the QC and the blank. The in-batch order of all samples analysed was randomised by using the http://www.random.org/sequences/ site. At the beginning of each batch one blank and 201 four QCs were injected. After this system equilibration, one QC was injected every six samples and at the end of the batch one blank was injected.

2.6. Data analysis

Raw data were converted into CDF format (Waters Databridge) and then processed using XCMS for feature extraction, grouping and alignment. For peak picking, the centWave algorithm was used with a peak width of 20-80 s and the signal to noise 207 parameter was set to $S/N = 4$. Data extraction parameters were selected on the basis of 208 the characteristics of chromatographic and mass spectrometric performance. The peak table output of XCMS was then used for statistical analysis with the software EZInfo SIMCA-P version 12.0.0 (Umetrics, Umea, Sweden), using Pareto normalization. The PCA plots of EZInfo SIMCA-P were used for quality control of the data sets by checking the distribution of the QC injections. Orthogonal partial least-squares discriminant analysis (OPLS-DA) was used to find features/tentative markers contributing to group/condition discrimination, based on the t-test with the Mann-Whitney U-test and the S-plot of SIMCA-P software.

Metabolite annotation was performed manually by applying the minimum 217 reporting criteria of the four identification levels reported by Dunn et al. (Dunn et al.,). For the 1st annotation level, mass accuracy (with less than 5 ppm error), isotopic distribution, at least one fragment and retention time were used and compared to those 220 of the authentic standard. For the 2^{nd} annotation level, mass accuracy (with less than 5 221 ppm error), isotopic distribution, at least one fragment, literature information about wine metabolome and chromatographic properties, and external databases such as HMDB, Kegg and MassBank were used. For further annotation exploration also MSe, MS/MS 224 and CAMERA were used. For the $3rd$ annotation level, where only a chemical formula was given, only mass accuracy (with less than 5 ppm error) and isotopic distribution were used.

Peak integration of all annotated compounds, internal standards and tentative markers was performed using the TargetLynx tool of MassLynx Software. Peaks areas emanating from this data were also used for quality control of the analysis by evaluating the variability of specific metabolites. For this part the raw LC-MS files were used and not the peak table exported from XCMS analysis.

3. Results and Discussion

3.1. Method development

In analytical chemistry method development is an important process, with which researchers try to determine the minimal combination of analytical steps required for the identification and quantification of one or more analytes in a specific matrix. In targeted methods these steps are well defined, and more or less easy to follow and accomplish, since they are based on commercial standards and the final scope is clear and solid. The opposite occurs with untargeted methods, because if the researcher focuses on

specific analyte(s) a bias towards that class of analytes is introduced, and the holistic character of the technique is annulled.

The main scope of this project was to study the effect of different storage conditions on the metabolic content of red wine products. A method previously developed by our group (Gika et al., 2012), able to quantify up to 135 polar metabolites, covering a central part of the chemical and biological variability of the primary metabolites, with 37 mono-, poly-saccharides and reduced monosaccharides (polyols), 37 organic aids, 31 amino acids, 22 amines and other biomolecules such as nucleosides and vitamins was adapted to an untargeted metabolite profiling method. The chromatographic apparatus (Waters Acquity UPLC) and the ESI source of both systems, UPLC-MS/MS and UPLC-QTOF MS, were almost identical, so chromatography and ionization were expected to be similar.

As it could be anticipated, because of the different nature of the two approaches 255 some parameters needed to be adapted and optimized in order to transfer the targeted method from triple quadrupole MS to a QTOF-MS untargeted method. The optimized parameters could be divided into two broad categories: sample preparation and LC-MS set up. The construction of this untargeted method started from optimization of LC-MS set-up, because this is more delicate as compared to sample preparation. A robust LC-MS method is a key feature in metabolomics for a number of reasons, especially for correct peak alignment. Poor chromatographic repeatability and peak shape in untargeted data-sets can prove very difficult to treat: peak alignment may fail, thus further complicating bioinformatic analysis; such problems may increase false positive and false negative results. A common practice to avoid misalignment in untargeted metabolomics is to analyse all samples in a single batch with as few interruptions as possible. It therefore becomes priority to keep chromatographic system robustness in

267 terms of retention time for long periods, covering at least the whole duration of a batch of the experiment.

To have unvarying retention times in HILIC mode it is very important to preserve 270 constant ionic strength during the measurements and throughout the different runs or analytical batches. For this reason, it was decided to use a stock buffer solution for the preparation of both A and B eluent, which is a practice used - but not common - in targeted analysis. A stock buffer solution offers the chance to prepare and re-prepare eluents with the same ionic strength in a convenient, fast and robust way for the whole length of the metabolomic experiment, which may last from a few days to several weeks. The previous buffer concentrations were optimized based on the shape of the peaks 277 detected. It was observed that for some peaks shape was improved by increasing the buffer concentration from 10 to 20 mM. Given that the highest buffer concentration to dissolve in the eluent A was 20 mM (Gika et al., 2012), it was decided to keep both strong and weak eluent at a 20 mM concentration. Both solvents were prepared by using the same stock solution of ammonium formate (4M). For better control of the ionic strength of the eluent, pH was adjusted to 4.8 before final dilution with the organic solvent (+2% ACN for A and +95% ACN for B eluent). In HILIC mode and in contrast to reversed phase LC, analytes often exhibit strongest retention in their ionized form. This tendency copes well with ESI-MS, since analytes elute from the column already ionized.

In HILIC mode if the analytes of interest are acids it is better to work at high to medium pH (2 pH units above analyte pKa values), while for bases the opposite is suggested: low to medium pH (2 pH units below analyte pKa values). Focusing only on one group of metabolites (acids or bases) cancels the holistic character of an untargeted method. Furthermore, the column manufacturer (Waters) advises using intermediate pH values (5-7) for methods targeting various type of analytes. For this reason and after

also considering the pKa of ammonium formate, it was decided to adjust the pH of both eluents to 4.8.

The next step to consider was sample preparation. For the targeted method three different sample dilutions were used for compound quantification, which is logical if one considers the large number of metabolites and the wide concentration range in real samples (Gika et al., 2012). Such a strategy is not an option in untargeted methods and only one method for sample preparation is used. However, sample preparation should be optimized with two key end-points: 1) to provide the maximum possible number of metabolites and 2) to protect the analytical system to maintain a stable signal throughout analysis. Given that it is not possible to measure the actual number of metabolites existing in the sample, the efficiency of sample preparation is commonly evaluated by the number of features. A very simple definition of a feature is "a molecular entity with a unique *m/z* and retention time". From our experience (Arapitsas et al., 2012, 2014; Mattivi et al., 2012) in wine metabolomics simple sample preparation can provide chromatograms with fewer features in comparison to typical sample preparation for targeted analysis of wine (e.g. via solid phase extraction, SPE). However, the final result of sample preparation is not biased by definition and from the beginning in favour of certain molecules. In this project, in agreement with previous studies (Arapitsas et al., 2012, 2014) we chose to use only dilution, followed by filtration prior to injection into LC-MS. This compromise was aimed to define the smallest experiment needed to build an holistic view of the polar metabolome.

In order to select the optimum dilution factor, four parameters were evaluated: the number of features, the precision of the profile acquired over 20 injections (Figure 1A), the grouping shown by the PCA plot (not shown) and the quality of a few selected peaks by visual inspection (Figure 2). A pooled QC sample of all wine samples was prepared and diluted with ACN 1:1, 1:2, 1:4, 1:6 and 1:9 v/v. Then 20 consecutive

injections of the undiluted wine and each of the diluted samples were performed with the optimised and adapted LC-MS method. The results of this experiment, shown in Figure 1A, illustrated that undiluted wine and the two highest dilutions (1:6 and 1:9 v/v) had a very similar low number of features (c. 6000); but this number for undiluted wine, as expected from our previous experience (Arapitsas et al., 2014), already decreased considerably after 10 injections. The 1:1 and 1:2 dilutions had the highest number of features (between 7000 and 7500), with the first showing a slightly higher number of features but the second showing better stability over the 20 injections. As explained above, system stability was given higher priority in this study and so the 1:2 (wine:ACN v/v) dilution was selected.

From the comparison of specific compounds/peaks it was observed that peak resolution improved at higher dilution factors, probably due to the peak broadening observed with the increase in water content in the injection solvent (Figure 2). Wine contains around 85% water and our chromatography starts with 98% ACN. In reversed phase inappropriate choice of injection solvent may result in peak broadening mainly in the first part of the chromatography, but in this HILIC experiment broad peaks and problems caused by inappropriate injection solvent were observed over the whole length 335 of the chromatogram. This was despite the fact that the injection volume (10 µL) was not 336 high for the flow rate used (400 μL/min). Some examples are presented in Figure 2, where it is clear that with the increase in ACN content (from the top to the bottom in the Figure) the peak shape improved, while in the case of sugar alcohols, resolution also increased. The peak shape got sharper not only for the early eluting uridine, but also for proline, which elutes in the middle of the chromatogram, and the late eluting raffinose (Figure 2).

In the injections of undiluted wine various double peaks were observed for the same metabolite (as shown for uridine and proline in Figure 2). This phenomenon

actually generated a higher number of features. Lower peak resolution (broader peaks) was also observed, which may result in a loss of features for closely-eluting analytes. Finally, detector signal saturation can cause problems such as ion/signal suppression but also problems in terms of mass resolution. The column manufacturer suggests a minimum of 75% ACN in the injection solvent. In this study, the best results were found with 66% ACN (resulting from the dilution of 1:2 v/v wine: ACN), but wine already contains 13% ethanol, which is protic/strong for HILIC solvent. To avoid precipitation problems, sample filtration was performed after dilution, just before LC-MS analysis.

The next step was to check system stability/robustness in a batch with a higher number of injections, which should be similar to real experiments and could also function as a pilot study. After a sequence of 55 injections (50 QC injections with one blank injection every 10 QC injections) the system continued to have acceptable signal stability, both in terms of the number of features and the peak area of selected compounds (Figure 1B). This experiment also shows that injection of blanks during an untargeted metabolomics sequence should be carefully planned. As shown in Figure 1B, 359 the number of features for the $21st QC$ injected following a blank injection is much lower as compared to all other QC injections. This could be attributed to chromatographic instability. At the same time it is possible to note a slight perturbation between the groups of QCs divided by the blanks (Figure 1B). In our experience, this phenomenon is regular rather than an exception. If the injection of blanks during a sequence is mandatory, then it is good practice to include 1 or 2 QC injections before the next real sample injection. Moreover, such pilot studies can provide information about the stability of prepared samples remaining in the autosampler, since the QC is a pooled sample of all samples and should have the same metabolic space and physicochemical properties. The results of this study confirmed the excellent stability of the LC-MS system for the

length of a typical metabolomic sequence and the integrity of the samples in the autosampler during analysis.

3.2 Wine storage experiment

The method optimization described above was applied to an experimental design concerning wine storage. The aim of this project was to study how the metabolome of wine changes in two different conservation conditions over a period of 24 months: a) optimum storage conditions in a wine cellar, as compared to b) typical domestic storage. 377 For the optimum storage conditions the temperature was kept stable at around \sim 16 °C during all seasons, and humidity was around 70%. In both cases the wines were kept in clean places, away from smells, light or heating systems and the bottles were in a horizontal position inside typical cardboard wine boxes. The latter parameters would seem appropriate for 'good' domestic storage, and are often also used in restaurants, wine stores, supermarkets and wine distributors, and are certainly not extreme. The only difference for domestic storage was that neither humidity nor temperature were 384 controlled: temperature was around 20 $^{\circ}$ C during the winter and between 20 and 27 $^{\circ}$ C in the summer period. To increase the biological variability of the sample set, 5 different red wines were used and a different bottle was sampled for each time point/storage (reference or time zero, 6, 12, 18 and 24 months). Figure 3 shows a PCA score plot of the HILIC-MS results, based on 6311 features recognised using XCMS. The QCs cluster in the middle of the plot, except for the first 4 QC injections required for column equilibration. This tight QC cloud is proof of good system stability over the whole length of analysis. QC injection distribution/variability is the most popular and reliable method for controlling the quality of the untargeted metabolomics dataset (Arapitsas et al., 2014; Franceschi et al., 2014; Gika, Theodoridis, et al., 2014; Godzien, Alonso-Herranz, Barbas, & Armitage, 2014; Sangster, Major, Plumb, Wilson, & Wilson, 2006), and it has

recently also been introduced to targeted analysis (Ehrhardt, Arapitsas, Stefanini, Flick, & Mattivi, 2014). In addition, the manual integration of 50 selected peaks (including all markers in Table 1) with TargetLynx showed excellent stability in terms of retention time (less than 1 %CV) and peak area (less than 20 %CV). Secondly, there was a clear time trend for wine stored with home/domestic conservation in PC4 (horizontally). There was considerable variability for the five different wines and this was largely seen in PC1. As regards the effect of storage conditions, domestic conservation caused larger overall changes. The wines stored in optimum conditions remained relatively close to the time zero samples, while the domestically stored wines were widely distributed and the 18 and 24 months time points in particular were clearly further apart from the previous time points (12 and 6 months). This was expected on the basis of our previous study of the same wines with reverse phase LC-MS analysis (Arapitsas et al., 2014), also providing proof of the validity and utility of the method.

To identify features differentiating the two storage conditions, the OPLS-DA discrimination analysis tool of SIMCA P (Umetrics, Umea, Sweden) software was applied to the peak table from XCMS analysis. OPLS-DA analysis highlighted 81 out of a total 6311 features as tentative markers for the two conditions (with Variable Importance in the Projection or VIP >2). Manual integration of these 81 features from the raw file data using TargetLynx allowed to remove redundancy, decreasing the number of tentative markers to 34. This step helped to detect false positives by applying independent evaluation of the markers selected through XCMS and OPLS-DA, since it was applied to raw data. The manually integrated areas made it possible to confirm or reject the statistical significance of each marker in distinguishing the two storage conditions; and to evaluate the instrumental variability of each specific marker during the analysis by using the QCs injections. Another way of eliminating false positives is visual inspection of the markers' MS spectrum and LC chromatogram. The confirmed 34

feature-markers correspond to 29 metabolites, since in this list one compound had four features and a second compound two features (Table 1). Of these tentative markers, phenolic compounds known (Arapitsas et al., 2014; Kallithraka, Salacha, & Tzourou, 2009; Monagas et al., 2005; Wirth et al., 2010) to be influenced by storage length and conditions were identified; these included quercetin, catechin, malvidin 3-glucoside and pyranomalvidin 3-glucoside. Quercetin was higher for domestic storage as the product of 427 the quercetin 3-glucoside hydrolysis in these conditions, while the other three were higher in the case of optimum cellar storage, in agreement with previous work by our group, where they were found to be more stable at lower temperatures (Arapitsas et al., 2014). In our RPLC-MS study, carried out with the same sample set, these four metabolites together with pantothenic acid (Figure 4) were found to be influenced by the storage conditions of the specific sample set. Moreover, the datasets obtained by the two platforms, RPLC-MS and HILIC-MS, shared 12 common features with significant differences for the two storage conditions (Table 1 and Arapitsas et al., 2014). Markers eluting in the solvent front in the RPLC study were retained by the HILIC column and vice versa. This confirmed the robustness of the instrumental set-up and data analysis parameters used in both studies, but also the complementarity of the two platforms.

Using HILIC-MS mode a degradation product of malvidin 3-glucoside was also shown to be higher for domestic storage (Table 1). Based on mass accuracy, isotopic distribution and other m/z ions of the same peak (see Table 1), we tried to provide the most probable molecular formula for all the 'unknown' metabolite markers. Although almost 250 polar commercial standards were injected into the LC-MS system (Shahaf et al., 2013) including the metabolites of the targeted metabolomics paper (Gika et al., 2012), the number of unknown markers was 21 (from 29). Since the injected chemical standard – reference material - list includes almost all commercial available polar primary metabolites (carbohydrates, amino acids, organic acids, etc.) and many polar

secondary metabolites known to be present in wine, it could be concluded that the metabolic space of wine is much bigger than is currently known and deserve further investigation. This is not surprising if we consider that wine is one of the most complex foods as far as the metabolomic profile is concerned, since grapes, yeasts, bacteria, fungi, exogenous antioxidants, fining agents and other oenological materials and ageing are involved in its preparation.

Different primary/secondary polar metabolites, including glucose, proline, hypoxanthine, xanthine, xanthosine, salicylic acid, hexoses, inositols, phenylalanine, betaine, citruline, uracil, choline, GABA, etc, did not show any statistically significant variation (data not shown). From the molecular formulas (Table 1) it becomes clear that most of the differentiating metabolites were nitrogen-contained (e.g. amines). The most promising marker was the peak with a retention time of 18.37 min, since it has one of the 459 highest VIP values and 4 features in Table 1. This metabolite, identified $(1st$ level identification) as 4-amino-heptanedioic acid (Figure 4), should not be confused with its isomer 2-aminopimelic acid, which eluted 0.5 min later in our chromatographic system. The ethyl ester of 4-amino-heptanedioic acid was another metabolite marker, higher in cellar conditions. There were two peaks with the same *m/z* and isotopic distribution between the markers (unknowns 12 and 16), which could correspond to the ethyl ester of 4-amino-heptanedioic acid, but only one had 3 ions similar to the acid. The correlation between 4-amino-heptanedioic acid and unknown 12 (tentatively identified as an ethyl ester of 4-amino-heptanedioic acid) across all samples was 0.76, but only 0.22 with unknown 16. On the other hand, unknown 16 had a correlation of 0.81 with pantothenic acid, but is probably just a fragment of the main ion, since the loss of one oxygen should not give a more polar metabolite. Table 1 reports the *m/z* and retention times of all markers and some extra information (fragments, coelution ions, molecular formulas, etc) which could be interesting for future work in the wine metabolomic field. Although some additional hypotheses about the structure could be made, in the light of the high possibility of false positive error when the retention time is unknown (Arapitsas, Langridge, Mattivi, & Astarita, 2014), it was preferred not to speculate further about the possible molecular form of the unknown markers. In Figure 4 the kinetic graphs of pantothenic acid and 4-amino-heptanedioic acid and their chemical structure are shown. The concentration (expressed in area) of both markers decreased much faster in domestic conditions. The vitamin pantothenic acid concentration in foodstuff is known to be influenced by storage conditions and especially by temperature. On the other hand, the literature lacks information about 4-amino-heptanedioic acid, not only as regards its behaviour in food in various storage conditions, but in general in relation to its importance, while this is the first time 4-amino-heptanedioic acid has been found in wine, to our knowledge.

- **4. Conclusions**
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In conclusion, it was shown that a good starting pointing for developing a good and robust untargeted HILIC LC-MS method was a similar targeted method already validated for its functionality. By applying this idea, a HILIC-MS metabolomics method for wine polar metabolites was developed. The majority of the chromatographic parameters were unchanged and for the adaptation only eluent preparation was optimized in order to have constant mobile phase ionic strength. The other key point optimized was sample preparation, with the intention of ensuring instrumental stability for long batches in terms of chromatographic parameters (peak resolution and retention time) and MS accuracy and sensitivity. Although HILIC is considered less robust as compared to RPLC, here it was possible to have comparable results. Finally the influence of storage conditions on wine metabolic space was also confirmed for polar

metabolites and especially nitrogen organic compounds. 4-amino-heptanedioic acid and its ethyl ester were detected for the first time in wine and were strong markers for distinguishing wine stored in optimum conditions.

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Figure Captions

Figure 1. A) The trend in the number of features for the pooled sample (QC) after 20 injections and in different dilutions with acetonitrile. B) LC-MS stability test of the optimised sample preparation for 55 consecutive injections.

Figure 2. Selected LC-MS chromatographic graphs for different compounds of the same sample (QC) in various dilutions with acetonitrile (not diluted wine, 1:1, 1:2, 1:4, 1:6 and 1:9 v:v wine:acetonitrile).

Figure 3. PCA plot of kinetic experiment analysis in the two storage conditions tested. The wines stored in optimum cellar conditions are shown with black dots, wines stored in typical domestic conditions in red, the reference wines in blue, and the QC samples in green. The numbers indicate the length of storage in months (0, 6, 12, 18 and 24 months).

Figure 4. Average change, based in 5 different red wines, of 4-amino-heptanedioic (a) and acid pantothenic acid (b) during storage in the two conditions (cellar **----** vs. domestic **- - -**). Areas correspond to integrated peaks calculated using TargetLynx.

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Scores Comp[4] vs. Comp[1] colored by File Text

Studying the effect of storage conditions on the metabolite content of red wine using HILIC LC-MS based metabolomics

Highlights

- · Adaptation of a targeted HILIC-MS method to untargeted metabolomics
- · HILIC-MS untargeted method validation for wine metabolomics
- · Slightly sub-optimum storage conditions had a major impact in wine metabolome
- · 4-amino-heptanedioic acid was annotated for the first time in wine
- · 4-amino-heptanedioic acid was a marker for wine sub-optimum storage conditions