

Direct introduction MALDI FTICR MS based on dried droplet deposition applied to non-targeted metabolomics on Pisum Sativum root exudates

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- 1 Direct Introduction MALDI FTICR MS based on dried droplet deposition
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applied to non-targeted metabolomics on Pisum Sativum Root Exudates

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4	Valentina Calabrese ^a , Isabelle Schmitz-Afonso ^{a,*} , Wassila Riah-Anglet ^b , Isabelle
5	Trinsoutrot-Gattin ^b , Barbara Pawlak ^c , Carlos Afonso ^a
6	^a Normandie Univ, COBRA, UMR 6014 and FR 3038, Université de Rouen, INSA de Rouen,
7	CNRS, IRCOF, 1 rue Tesnières, 76821 Mont-Saint-Aignan, Cedex, France.
8	^b UniLaSalle, AGHYLE Research Unit UP 2018.C101, Rouen Team, 76134 Mont-Saint
9	Aignan, SFR Normandie Végétal FED 4277, 76000 Rouen, France.
10	^c Laboratoire GlycoMEV UR 4358, Université de Rouen Normandie, SFR Normandie
11	Végétal FED 4277, 76000 Rouen, France
12	
13	*Corresponding author at : Normandie Univ, COBRA, UMR 6014 and FR 3038, Université
14	de Rouen, INSA de Rouen, CNRS, IRCOF, 1 rue Tesnières, 76821 Mont-Saint-Aignan,
15	Cedex, France. E-mail address : isabelle.schmitz-afonso@univ-rouen.fr
16	
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- 18 Resonance Mass Spectrometry, MALDI, Pisum sativum
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20 Graphical abstract



22 Abstract

23 Non-targeted metabolomic approaches based on direct introduction (DI) through a soft ionization source are nowadays used for large-scale analysis and wide cover-up of metabolites 24 in complex matrices. When coupled with ultra-high-resolution Fourier-Transform ion 25 26 cyclotron resonance (FTICR MS), DI is generally performed through electrospray (ESI), which, despite the great analytical throughput, can suffer of matrix effects due to residual salts 27 28 or charge competitors. In alternative, matrix assisted laser desorption ionization (MALDI) 29 coupled with FTICR MS offers relatively high salt tolerance but it is mainly used for imaging 30 of small molecule within biological tissues. In this study, we report a systematic evaluation on the performance of direct introduction ESI and MALDI coupled with FTICR MS applied to 31 32 the analysis of root exudates (RE), a complex mixture of metabolites released from plant root tips and containing a relatively high salt concentration. Classic dried droplet deposition 33 34 followed by screening of best matrices and ratio allowed the selection of high ranked conditions for non-targeted metabolomics on RE. Optimization of MALDI parameters led to 35 improved reproducibility and precision. A RE desalted sample was used for comparison on 36 ionization efficiency of the two sources and ion enhancement at high salinity was highlighted 37 in MALDI by spiking desalted solution with inorganic salts. Application of a true lyophilized 38 39 RE sample exhibited the complementarity of the two sources and the ability of MALDI in the detection of undisclosed metabolites suffering of matrix effects in ESI mode. 40

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42 **1. Introduction**

Non-targeted metabolomics is a growing field of 'omics' which enables the unbiased 43 detection and annotation of a wide range of molecules at low molecular weight (< 1500 Da) in 44 biological samples [1–6]. In the case of plant science, metabolite profiling could give access 45 to the characterization of primary and secondary metabolites which are widely involved in 46 plant growth, development and health or adaptation to abiotic and biotic stress. It could be 47 drought, extremes temperatures, salinity or attack by pathogenic microorganisms [7–13]. 48 Non-targeted metabolomic is typically performed through nuclear magnetic resonance (NMR) 49 [14,15] and mass spectrometry (MS) [16]. Over the past decades, MS coupled with gas (GC-50 MS) [17] or liquid chromatography (LC-MS) [18] has been widely used as preferred 51 technique for the detection of a wide range of compounds in plant material. In the case of 52 complex matrices, LC-MS allows the separation of isomeric and isobaric species before their 53

detection as ions in gas-phase [19]. Chromatographic separation allows a reduction of sample 54 complexity but it is a highly time-consuming technique and it presents some limitations in 55 large-scale non-targeted metabolomic studies [20]. Recently, non-targeted metabolomic 56 approaches based on the direct introduction (DI) of the sample into the ion source have been 57 proved to enable faster analysis for large-scale study and wide cover-up of metabolite 58 detection [21,22]. Among these, direct introduction coupled with ultra-high-resolution 59 analyzers as in Fourier Transform ion cyclotron resonance mass spectrometry (FTICR MS) 60 [23,24] has been increasingly used in non-targeted metabolomic thanks to its advantages in 61 62 ultra-high resolving power, high mass accuracy and dynamic range [25–28]. Recently, many studies have been published on the potentiality of FTICR MS to perform a global profiling of 63 64 metabolites in plants material [27-31]. FTICR analyzers enable separation according to the cyclotron frequency produced by the rotation of ions in a fixed magnetic field and the 65 66 simultaneous detection of all m/z over a time range [32]. In this extent, when coupled with FTICR MS, direct introduction allows to obtain a constant number of ions entering into the 67 68 ICR cell during wide time ranges, leading to ultra-high resolution and mass measure precision. For this reason, direct introduction FTICR MS is normally preferred over 69 70 hyphenation with liquid chromatography. Direct introduction FTICR MS coupled with 71 electrospray (ESI) is routinely used as preferred source in non-targeted metabolomic studies because it enables the easy and efficient ionization of a wide range of metabolites 72 73 characterizing many biological matrices [33–35]. However, ESI suffers from some analytical 74 limitations as matrix effects [36]. In fact, when a wide number of different analytes is injected in the source, ions might compete as charge carriers (ion competition) or species at high 75 76 abundance can lead to reduced sensitivity of low abundance ones (ion suppression) [37–39].

Matrix assisted laser desorption ionization (MALDI) is an alternative ion source which 77 enables the soft ionization of a wide range of metabolites in biological samples [40]. This is 78 79 normally performed through the use of an organic matrix which assists the transfer of the laser energy to the analyte, enabling the ionization and reducing ion fragmentation. MALDI 80 81 enables the performant detection of metabolites in complex biological samples without preliminary clean-up or separation before analysis. However, when coupled with classical 82 mass analyzers such as time of flights, the presence of matrix ions in the low m/z zone limits 83 its applications in the analysis of low molecular weight compounds [41]. MALDI has 84 therefore been applied mostly in the analysis of large organic biomolecules such as lipids and 85 proteins[42,43], peptides [44,45] and saccharides [46] or in whole-cell samples analysis for 86 87 the detection of intact microorganisms [47]. Lately, coupling with FTICR MS has boosted

application of MALDI in low molecular weight compounds discovery thanks to improved 88 molecular formula assignment for isobaric ions [48,49]. Nonetheless, MALDI-FTICR MS is 89 nowadays mainly used in metabolomics to highlight the spatial distribution of a reduced 90 number of compounds within biological tissues [50,51]. Many studies point out on imaging 91 for biomedical applications or in plant science [52-58]. Nonetheless, to the best of our 92 knowledge, few studies points out on a non-targeted metabolomic approach based on the 93 direct introduction of a biological sample based on MALDI-FTICR MS [59]. In fact, the 94 highest drawback of mass spectrometry based on MALDI is that, besides from problems 95 96 connected to the noise in the low mass region [60], ionization depends strictly on the homogeneity of the matrix-sample spot [61]. This can lead to issues as lack of reproducibility 97 98 for qualitative and mostly quantitative analysis [62].

In this study we present for the first time an analytical optimization of a non-targeted 99 100 metabolomic approach based on ultra-high-resolution mass spectrometry coupled to direct introduction MALDI for improved metabolite detection and reduced ion suppression in 101 102 presence of salts. This method has been optimized on plant root exudates (RE), because this complex biological cocktail contains a high number and diversity of molecules and residual 103 104 salts [11]. Indeed, RE is a mixture of primary and secondary metabolites produced by the 105 plant roots and continuously released into the narrow zone of soil surrounding roots called the rhizosphere [12]. These include many compounds of different nature which take a large part 106 in the interactions between plants and their environment [63,64], especially with the 107 108 rhizosphere microbiota essential to plant growth, health and resistance to biotic or abiotic stress [12,64–67]. Deciphering molecular signals exchanged between the root and its 109 microbiota would be an important advancement in plant science and a great hope for 110 agroecology, because a better control of interactions in the rhizosphere could allow limitation 111 of phytochemical inputs in agricultural processes [68]. These objectives could be reached 112 through the metabolomic investigation and profiling of plant RE [11,69]. Nonetheless, due to 113 the complexity of RE composition and its variability with plant growth conditions and variety, 114 115 performing metabolomic studies of root exudates is challenging and many efforts are required for the optimization of both RE collection [70] and analysis through mass spectrometry 116 techniques [71]. RE sampling is usually divided in two steps consisting in plant growth and 117 metabolite extraction [72]. Among many plant growth methods, artificial hydroponic systems 118 are widely used as they enable an easier handling of plants and improved reproducibility with 119 low root damage and reduced metabolites absorption from matrix [70,73]. In hydroponics, 120 121 plant growth is obtained through immersion of seeds and roots in a nutritive medium

containing macronutrient [74]. Once growth completed, RE can be collected by rinsing, then 122 transferring the root system from the hydroponic medium to a solvent that is compatible with 123 analysis (i.e. water) [75,76]. It is worth to note that, in RE samples obtained from hydroponic 124 systems, metabolites occur at mM-nM concentrations; while a relatively high concentration 125 of macronutrients (mM) may be present after re-concentration of RE samples [77]. Therefore, 126 in the case of mass spectrometry-based metabolomics coupled with direct introduction, 127 metabolite extraction and salt removal are highly advised to obtain the preferential ionization 128 129 of the metabolites over suppression and competition effects [71].

130 Here, we evaluated the performances of MALDI-FTICR MS based on dried droplet deposition to a non-targeted metabolomic approach for the detection and annotation of low 131 132 abundance metabolites in Pisum sativum RE. Literature presents many studies on P. sativum RE showing the presence of amino acids, sugars and organic acids [78], while few 133 134 investigations focus on the isolation and characterization of secondary metabolites. The main chemical classes have been found to be triterpenes [79], polyphenols [80,81], alkaloids [82] 135 and some classes of specialized phytohormones [83-85]. Nonetheless, to the best of our 136 knowledge, this is the first non-targeted metabolomic study on P. sativum RE. In this study, a 137 P. sativum RE desalted sample was first submitted to a classic non-targeted metabolomic 138 approach based on data dependent acquisition mass spectrometry (DDA-MS) and to ESI-139 FTICR MS. A collection of 48 metabolites were annotated with a hypothetical structure and a 140 global profiling with an insight of different chemical classes was obtained via unique 141 molecular formula assignment. This information was used for the main aim of this study, 142 which attempted a development of a non-targeted metabolomic approach based on MALDI-143 FTICR MS. A screening on the performances of six MALDI matrices and 36 different 144 145 conditions (sample/matrix ratio, with or without addition of acid) led to the selection of three optimal combinations which enabled a satisfying non-targeted metabolite detection. 146 147 Moreover, a rigorous control of experimental parameters such as the laser power used for MALDI measurements enabled an improvement of mass accuracy without complex sample 148 149 deposition, which was based on the dried droplet method. MALDI resulted a complementary technique, leading to a ~60% increase of detected metabolites at both low and at high m/z150 151 values. Matrix effects arising from increased salinity in ESI-FTICR MS and MALDI-FTICR MS mode were evaluated on desalted P. sativum RE samples which were spiked with 152 153 increasing amounts of salts. Lastly, the optimized non-targeted metabolomic approach based

154 on MALDI was tested on a true lyophilized *P. sativum* RE sample containing a natural 155 amount of salt arising from the exudation step.

156

157 2. Material and methods

158 **2.1 Collection of plant root exudates.**

Plant seeds were purchased from RAGT Semences (Toulouse, France). Seeds were cleaned 159 and stored in containers at 5 °C in a cool room until use. Pea seeds were soaked twice for 10 160 161 min in an ethanol solution (96%) and then in a hypochlorite solution (26%) under stirring. After each immersion, the seeds were rinsed six times with demineralized sterile water (10 s 162 163 per rinse). The disinfection process was carried out in sterile conditions. For germination, sterilized seeds of pea were cultivated in boxes with agar (1%). The seeds were germinated in 164 phytotronic chamber at a day/night cycle: 16 h, 23 °C / 8 h, 20 °C for a period of 7 days. After 165 germination, seed were transferred in a hydroponic system containing ¹/₄ Hoagland nutrient 166 167 solution and cultured in a phytotronic chamber in the same condition as germination. A list of the oligo and micro elements with their concentration in the ¹/₄ diluted Hoagland solution can 168 be found in table 1S. Five weeks growth seedling characterized of 6-8 leaves each plant were 169 170 used for exudation. Briefly, the plants roots were removed from the Hoagland solution and briefly rinsed with sterile deionized water to remove the remaining nutrient solution. The 171 plants were then transferred to backers containing 500 mL sterile ultrapure water. Exudation 172 was carried out for 1h, roots were then removed and the solutions frozen at -20°C in glass 173 bottles. A blank solution was prepared using 500 mL sterile ultrapure water which was 174 incubated in the similar conditions as backers of root exudates. 175

176 **2.2 Metabolites extraction.**

Two sample treatment methods were used for metabolites extraction and concentration. 177 178 Desalted sample which contained an enriched fraction of P. sativum RE were obtained through solid phase extraction (SPE). Briefly, frozen P. sativum RE (500 mL) were 179 180 completely thawed, distributed in tubes (Falcon) and solutions were centrifugated at low temperature (5°C) for 15 min at 10 000 rpm (Eppendorf 5804 R) in order to remove cell 181 182 debris and eventual particles. Aliquots of supernatant liquid were collected to reach a final 183 volume of 420 mL. Centrifuged RE solution were then submitted to SPE on an automated SPE WorkStation (6.25ws, Interchim France). A column filled with a hydrophilic modified 184

styrene-based polymer (PolyClean HLB, 3 mL x 200 mg, Interchim France) was used for the 185 extraction of metabolites. The HLB column was washed prior to sample loading with 5 mL of 186 methanol and 5 mL of water at a flow rate of 15 mL/min. RE were then passed through the 187 activated polymeric cartridge at 3 mL/min. The polymeric phase was washed with 4 mL of 188 LC-MS water at 3 mL/min and dried for 10 min using a gentle stream of nitrogen. Elution 189 was then performed by passing through 3 mL methanol at 2 mL/min. Time spent for SPE 190 extraction was around 3h for sample. The fraction was then dried completely under a nitrogen 191 stream and resuspended in 250 µL of water. Blank was treated likewise. Samples were kept at 192 193 low temperature (5-7°C) during SPE and evaporation by soaking bottles in ice. This assured minimal degradation of metabolites during the time-consuming sample treatment. For 194 lyophilized samples, sample treatment was similar, except that after centrifugation the final 195 volume of 420 mL RE was distributed in clean tubes, frozen at -20°C for 24h and then 196 lyophilized using a freeze dryer (BUCHI LyovaporTM L-200). The lyophilized sample and a 197 blank were resuspended both in 250 µL of water. SPE and lyophilized samples were stored at 198 199 -20°C until analysis.

200 2.3 Sample preparation and DDA-MS measurements for metabolites annotation.

P. sativum RE SPE extracts were thawed before analysis and solutions were directly 201 submitted to DDA-MS without further treatment. The mass spectrometer was a hybrid 202 quadrupole-time-of-flight instrument (QTOF, Synapt G2 HDMS, Waters MS Technologies, 203 Manchester, UK) [86] coupled with an ultra-high-performance liquid chromatographic 204 (UHPLC) system equipped with a diode array detector (Vanquish, Thermo Scientific, San 205 Jose, CA, USA). The travelling wave ion mobility cell included in the instrument was not 206 used during analysis. The column used for the elution was a reverse phase ACQUITY UPLC 207 208 HSS T3 1.7 µm of dimension 1.0 mm x 100 mm (Waters Manchester, UK) equipped with a 0.2 µm prefilter. The sample tray and column oven temperatures were set at 8 °C and 50 °C, 209 210 respectively. The injection volume was set at 5 µL for MS/MS measurements in positive mode and 10 µL in negative mode. Flow rate of 0.100 mL/min was used. Mobile phase A 211 212 consisted of water + 0.1 % formic acid and mobile phase B of acetonitrile + 0.1 % formic acid. The elution was the following: 0-2 min, 0% B; 2-3 min, 0-10% B; 3-10 min, 10-20% 213 214 B; 10-14 min, 20-100% B; 14-17 min, 100% B; 17-18 min, 100-0% B; 18-25 min, 0% B. DDA-MS experiments were performed over a m/z 50–1200 range in resolution mode 215 216 (resolution 20 000 FWHM). A sodium formate solution was used for external calibration 217 while a continuous lock mass correction was applied by infusing leucine enkephalin via the

LockSpray[™] interface (reference scan frequency 10 sec, lock spray capillary 3.0 kV and cone 218 voltage of 25 V in positive mode and respectively 10 s, 3.0 kV and 50 V in negative mode). 219 Source in positive mode was operated as following: capillary 3 kV, sampling cone 25 V, 220 extraction cone 5 V. The source temperature was 120°C, the cone gas flow and the 221 222 desolvation gas flows were set respectively to 20 L/h and 600 L/h; desolvation temperature 300 °C. For negative ion mode, parameters were the same excluded for the capillary which 223 was set at 2.2 kV. Metabolites were fragmented automatically through a survey scan function 224 when the precursor threshold peak intensity exceeded 1000 counts in positive mode and 800 225 226 scans in negative mode. For each MS scan, the 3 most intense MS/MS ions were fragmented using 4 MS/MS scans accumulation. Then, each fragmented ion was excluded for 6 seconds 227 with a scan time of 0.200 sec and an interscan time of 0.024 sec. Experiments were performed 228 in the transfer cell which was filled with argon (6.10^{-3} mbar), using collision energy ranging 229 230 from 10-20 eV for low m/z values to 10-30 eV for high m/z values. A linear variation was used along the whole range. The trap cell of the instrument was operated using a background 231 232 collision energy of 4 eV.

For metabolites annotation, raw data were submitted to accurate mass measure on MassLynx 233 234 (v. 4.2, Waters Corporation) and then converted in mzXML open format through the MSConvert tool of ProteoWizard (v. 3.0.9992) using MS1 and MS/MS levels as filters. Raw 235 data were then uploaded on the Global Molecular Networking Platform (GNPS, 236 237 https://gnps.ucsd.edu) [87,88] and experimental spectra were queried against library search 238 using the spectral library search in order to find possible matches. Ions corresponding to contaminants or matrix were subtracted automatically through the GNPS analysis. Metabolite 239 annotation was performed on manual literature search for some abundant metabolites for 240 which no match was found on GNPS databases. 241

242

243 **2.4** Sample preparation and ESI-FTICR MS measurements.

For ESI measurements, 100-fold diluted solutions in water/methanol (50/50, v/v) for both SPE and lyophilized samples were prepared. For measurements in positive ion mode, 0.1 % formic acid was added to the final diluted solution in order to favor protonated forms. Solutions were introduced directly in the electrospray source of a high-field FTICR mass spectrometer (SolariX MRMS, Bruker Bremen, Germany), equipped with a 12 T superconducting magnet and a dynamically harmonized ICR cell, in both positive and negative ion modes. Samples were introduced to the ion source through a syringe pump at a flow rate of 90.0 μ L min⁻¹. Spectra were recorded at a transient length of 1.12 s (4 million points) with an accumulation time of 0.050 s in positive mode and 0.100 s in negative mode. A sodium trifluoroacetate solution at 0.1 mg/mL in acetonitrile/water (50/50, v/v) was used for external calibration by the acquisition of 30 accumulated scan spectra. Mass spectra were acquired over a *m/z* 98–1500 range. A mass resolving power of around 700,000 at *m/z* 200 was achieved. A complete list of parameters used for ESI measurements can be found in Table 2S.

258 2.5 Sample preparation for MALDI-FTICR MS measurements

For MALDI measurements, six matrices were chosen among the most used in MALDI 259 literature. These were: 2,5-Dihydroxybenzoic acid (DHB), alpha-Cyano-4-hydroxycinnamic 260 261 acid (α-CHCA), Sinapinic acid (ScA), trans-2-[3-(4-tert-Butylphenyl)-2-methyl-2propenylidene] malononitrile (DCTB), 1,5-Naphthalenediamine (DAN) and 9-Aminoacridine 262 (9-AA). Regarding matrix preparation: DHB and ScA were prepared at a concentration of 10 263 mg/mL in water/methanol (50/50 v/v) and 9AA at a concentration of 9 mg/mL; α-CHCA at 264 10 mg/mL in MeOH/ACN (50/50 v/v), DCTB and DAN at 10 mg/mL in MeOH. The same 265 266 solutions were prepared in duplicate and added of 0.1 % formic acid on the final volume. SPE and lyophilized samples were then mixed without further dilution with the seven matrices 267 268 with a ratio sample:matrix of 1:1, 2:1 and 1:10. Then, for each mixture, two additional conditions were tested, namely with or without the addition of 0.1 % of formic acid (FA). The 269 270 dried droplet method was used for sample deposition on a target plate (MTP 384 target plate ground steel BC, Bruker Daltonics, Germany) and for each sample, 5 µL were deposed for 271 each spot, on three different positions and samples gently dried under vacuum. For external 272 calibration in positive mode, a mixture of the 3 peptides bradykinin, leucine enkephalin and 273 angiotensin (each at a concentration of 10 pmol/µL in water) was prepared at a proportion 274 1:1:1:3 with DHB at 10 mg/mL. In negative ion mode, a solution of 9-AA at 10 mg/mL was 275 used for external calibration. For direct introduction MALDI-FTICR MS measurements, laser 276 shots value was fixed to 200 for all matrices while laser power was optimized in order to 277 reach a 10% ionization threshold. Laser power was set as follow: in positive mode for DHB at 278 20, for α -CHCA and DCTB at 14 and for ScA at 28. In negative mode for DCTB at 11, for 279 DAN at 14 and for 9AA at 26. Values of the laser power were set as following for 280 optimization in positive mode: for DHB at 12, 15, 17, 18, 20, 22, 24, 26; for α -CHCA at 8, 9, 281 10, 12, 13, 14, 15, 18; for ScA at 12, 15, 18, 19, 20, 22, 25, 27, 29, 32, 35, 37; for SA at 12, 282 283 15, 18, 19, 20, 22; for DCTB at 6, 7, 8, 9, 10, 12, 15, 16 and in negative mode: for 9AA at 15,

17, 20, 23, 25, 27, 30 and 32; for DAN at 10, 13, 14, 15, 17 and for DCTB at 6, 8, 10, 11, 12, 284 13 and 15. Curves fitted to sigmoid were obtained through the Boltzmann function on 285 OriginPro 2018 (v. b9.5.0.193). Figure 1S shows the curves obtained for optimization of the 286 laser power and the 10% threshold values for the investigated matrices. Except for source 287 parameters, all other experimental parameters used to perform MALDI-FTICR MS 288 measurements were set as in ESI-FTICR MS. These, together with additional parameters of 289 the MALDI source, can be found in table 2S. Experimental design, parameters for internal 290 calibration, molecular formula attribution and data visualization were performed accordingly 291 292 to ESI-FTICR MS measurements.

293 **2.6** Sample preparation for salt tolerance evaluation

In order to evaluate the salt tolerance of the two sources coupled with FTICR MS, series of 294 295 solutions spiked with increasing amount of salts were prepared and injected in the instrument. ¹/₄ diluted Hoagland solution was used for the evaluation as used nutritive solution for plant 296 growth. For ESI-FTICR MS measurements, 100-fold diluted SPE solutions in water/methanol 297 (50/50, v/v) were used, while for evaluation on MALDI-FTICR MS, the SPE solution with 298 the DHB matrix 1:10 +0.1 % FA was the only investigated. Salt solution was added at a 299 percentage of 0.01%, 0.05%, 0.1%, 0.5%, 1%, 5% and 10% on the final volume of the 300 obtained solutions for ESI- and MALDI-FTICR MS. Measurements were performed in the 301 302 two modes according to the experimental parameters used before and each acquisition was performed on 50 accumulated scans. 303

304 2.7 Data analysis for ESI-FTICR MS and MALDI-FTICR MS measurements

Following data acquisition, all data arising from both ESI- and MALDI-FTICR MS 305 measurements were treated on Bruker Compass DataAnalysis software (v. 5.1). Each 306 accumulated mass spectrum was peak picked (S/N 8), then mass calibration was confidently 307 performed using a mass list of Pisum Sativum RE metabolites identified through DDA-MS 308 (Table 3S). Standard deviation on m/z values determined after internal calibration on a set of 309 310 34 points was found to be below 0.100 ppm using a linear fit. Spectra related to samples were subtracted of blanks in Xpose mode with ratio 5 and molecular formula were assigned on the 311 312 subtracted spectra with the common boundaries: C₁₋₅₀, H₁₋₁₀₀, N₁₋₈, O₀₋₃₀, S₀₋₁ and P₀₋₁. Attribution was performed considering M + H protonated forms and M + Na, K, Ca adducts 313 314 for positive mode, while in negative mode only M - H forms were retained. Molecular formulas were assigned for peaks with relative intensity threshold of 0.2 %, within a mSigma 315

limit of 800 and a tolerance mass error of 0.1 ppm. RDBE limit were set from 0 to 80 and H/C 316 ratio from 0 to 3. Data containing assigned formula were exported and manually handled to 317 avoid molecular formula redundancy (molecular formula arising from protonated and adduct 318 forms). Visualization of van Krevelen and double bond equivalent (DBE) plots were obtained 319 through an in-house script. For ESI- and MALDI-FTICR MS, performance evaluation 320 measurements for both 50 and 200 accumulated spectra were acquired in triplicate. For salt 321 tolerance evaluation with the two sources triplicate analysis were acquired by accumulating 322 50 spectra. Reduced time for analysis was used to limit major salt contamination of ESI 323 324 source at high salt concentration.

325 2.8 Solvents and reagents

All solvents and additives used to prepare mobile phases and sample solutions for ESI- and MALDI-FTICR MS measurements were LC-MS grade and they were purchased from Fisher Chemical (Pittsburgh, PA). 2,5 Dihydroxybenzoic acid, 9-aminoacridine and trans-2-[3-(4tert-Butylphenyl)-2-methyl-2-propenylidene] malononitrile were at 98% purity. 1,5-Naphthalenediamine, sinapinic acid and sinapic acid were at 99% purity. All matrices were purchased from Sigma-Aldrich (Saint Luis, MO, USA). LC-MS grade formic acid used for sample acidification was purchased from Sigma-Aldrich (Saint Luis, MO, USA).

333

334 **3. Results and discussion**

Root exudates were submitted to preliminary DDA-MS and to ESI-FTICR MS analysis. This 335 allowed to perform at first the annotation of major compounds based on the manual 336 dereplication of fragmentation spectra and on the use of annotation tools as GNPS. Secondly, 337 338 thanks to the van Krevelen diagram the global metabolic profile of *P. sativum* root exudates was obtained, highlighting the main chemical families. Once characterization performed with 339 340 the two first techniques, sample were therefore subjected to MALDI-FTICR MS. The next paragraphs are dedicated to the description of the results with the different mass spectrometry 341 platforms used for the analysis of RE. A summary of the analysis, annotation and 342 343 interpretation workflow is showed in Figure 1.



Fig. 1: Workflow used for the non-targeted metabolomic profiling of P. sativum root exudates
based on DDA-MS, ESI-FTICR and MALDI-FTICR complementarity

347 3.1 Identification of *Pisum sativum* root exudates based on DDA-MS measurements and 348 direct introduction ESI-FTICR-MS

At first, DDA-MS measurements on P. sativum RE extracts obtained from SPE extraction 349 were performed in ESI positive mode through a hybrid QTOF mass spectrometer. 350 Experimental spectra were then submitted to literature manual search and database match on 351 the GNPS website. A list of metabolites for the 48 major compounds with proposed 352 annotation based on MS/MS spectra can be found in table 3S. The common metabolomic 353 annotation level was used to rank confidences in proposed metabolite structures [89]. The 354 355 compounds of interest belonged to seven molecular classes, namely nucleosides, amino acids, fatty acids, fatty acid amides, alkaloids, oligopeptides, phosphocholines and triterpenes. In 356 addition to the main compound classes, other minor features presented fragmentation spectra 357 agreeing with polyphenols, glucosyl-phenols and indoles. In this study, on a total of 48, 34 358 features were annotated at level 2 of confidence and 14 features at a level 3. In fact, some of 359 the most intense metabolites detected via DDA-MS experiments did not found match with 360 literature or database search. For example, feature 19 at m/z 367.1863 and molecular formula 361 $C_{18}H_{26}N_2O_6$ was detected together with two analogues and an isomer (features 23, 25, 27) 362 which were separated through chromatography. The fragmentation spectrum (figure 2S) 363 presented two losses of 18 Da with fragment ions at m/z 349.17 [C₁₈H₂₄N₂O₅+H]⁺, m/z 331.16 364

 $[C_{18}H_{22}N_2O_4+H]^+$, and fragments at lower m/z corresponding to m/z 139.06 $[C_6H_6N_2O_2+H]^+$, 365 m/z 121.04 [C₆H₄N₂O+H]⁺ and m/z 90.05 [C₅H₄N₂+H]⁺. These metabolites presented a 366 fragmentation pathway similar to that of N-acyl homoserine lactones [90] and they were 367 therefore annotated as fatty acid amides containing histidine or urocanate connected with a 368 C18 or a C16 alkyl chain. Fatty acid amides, as N-acyl homoserine lactones, have been found 369 370 to have an important role as *quorum sensing* molecules for bacteria communication and cooperation, especially in biofilm formation [91,92]. Moreover, it must be noted that histidine 371 and urocanic acid (a product of histidine metabolism) are found at high concentration in the 372 373 genus Fabaceae, which P. sativum belongs to, supporting the proposed annotation made for the fatty acid amides.[93]. Nonetheless, it must be noted that the fragmentation pathway 374 375 showed some similarities with database spectra of some alkaloids as imidazole [94] or isoquinoline alkaloids [95]. Hence, this alternative annotation should not be excluded. 376 377 Annotation as fatty acid amides was kept as the most trustable because the analyzed fraction showed the presence of many metabolites connected to lipid and lipid-like molecules. In this 378 379 regard, our study pointed out on the presence of specialized metabolites, not yet isolated and discovered that can be a starting point for further research. The unambiguous identifications 380 381 of the proposed metabolites should be performed through comparison of the experimental 382 results with standard compounds or with complementary techniques as isolation and characterization through NMR. For many of the proposed metabolites, the biological role in 383 P. sativum root exudation process as not been yet discovered, but according to published 384 literature, P. sativum RE contain a high number of nitrogen-containing compounds with basic 385 functional groups that are ionized preferentially in positive mode [96]. In fact, nitrogen 386 compounds have been found to cover an important role in root-bacteria communication and 387 ecosystem functioning. Metabolites for which a hypothesis of structure was formulated (Table 388 3S) were used to create a list of reference compounds to be used as internal mass calibrants in 389 ESI-FTICR MS measurements. Chemical classes were then used to gather the additional 390 features detected through ultra-high-resolution mass spectrometry measurements and to 391 392 discuss the differences in ionization via ESI- and MALDI-FTICR MS (next paragraphs).

Once the first information on *P. sativum* RE obtained, 100-fold diluted RE SPE extracts were then submitted to ESI-FTICR MS analysis. Mass spectra of both samples and blanks acquired in positive mode accumulating 200 scans where then internally calibrated using a linear fit. The standard error over a m/z 98-1500 range was lower than 0.100 ppm. After blank subtraction, molecular formulas were attributed for one analytical replicate according to the rules described in the materials and methods section. The wide diversity of heteroatoms (N, P,

S) and the presence of many adducts (Na, K and Ca) led often to multiple formula for each 399 peak, especially for high m/z values in positive mode. No other adducts (Mg, Mn) resulted in 400 preliminary formula assignment trials and they were therefore not considered. In general, 401 402 when a double assignment was present, peaks were checked manually to remove unlikely molecular formula. This was performed when possible, based on the highest fit of the isotopic 403 fine structure distributions for proposed formulas and experimental peaks. Conversely, the 404 most logical formula based on the molecular classes that were found through DDA-MS 405 experiments was retained. Nonetheless, it must be considered that different adducts could be 406 407 present for the same molecule. For this reason, the obtained list was further cleaned up in order to reduce data redundancy and avoid that one molecule ionized in different forms (for 408 409 example H⁺ form and Na⁺ form) could led to many different H/C ratios. Hence, molecular formulas of protonated forms were subtracted of a hydrogen and molecular formulas 410 411 corresponding to Ca adducts were added of a hydrogen. Formula for K and Na adducts were kept unaltered. The list of molecular formula was then used to plot H/C ratios in function of 412 413 O/C ratios and construct therefore the van Krevelen diagram (figure 3S) for ESI ionization. An in-house Python script was used for data visualization. As expected, an increase of the 414 415 number of detected features was obtained thanks to ESI-FTICR MS measurements, with 486 416 molecular formulas assigned in positive mode for the SPE sample. At our best, resulting annotation were submitted to PubChem search in order to propose insight on molecular family 417 and subclasses. Figure 3Sa shows that P. sativum RE was characterized by a significant 418 419 number of nitrogen-containing compounds, which consisted in a wide range of nucleosides and cytokines, amino acids and small oligopeptides, fatty acid amides, alkaloids and 420 phosphocholines. Compounds that did not contain nitrogen or other heteroatoms were 421 confirmed to be the triterpenes soyasaponins, a wide range of fatty acids that includes some 422 plant hormones as jasmonic acid derivates or flavonoids. Among CHO compounds, a group of 423 features that were not detected in DDA-MS had a molecular formula corresponding likely to 424 glycolipids, which was taken as the best annotation. Moreover, thanks to the hypothesis of 425 426 structures and information on the molecular families present in the sample, some unconventional molecular families were assigned for the first time to a definite zone of the 427 van Krevelen diagram (Figure 3Sb). For example, it was possible to trace back the N-428 acylethanolamines at H/C = 2.0 and O/C = 0.1, the fatty acid amides containing histidine or 429 urocanic acid at H/C = 1.5 and O/C = 0.3 in a zone normally designed for oligopeptides, the 430 soyasaponins glucosides at H/C = 1.6 and O/C = 0.4. Similarly, oligopeptides at high N 431 number (N=6 or 7) were placed at H/C = 1.3 and O/C = 0.2 and glycolipids in an intermediate 432

zone between fatty acids and sugars, at H/C = 2 and O/C = 0.5. The list of metabolites found 433 through ESI-FTICR MS can be found in supplementary material. In general, all molecular 434 formula for the compounds found through DDA-MS were found in their protonated or Na⁺, 435 K⁺ and Ca²⁺ adducts and were therefore confirmed through ESI-FTICR MS, giving a higher 436 confidence level in metabolites annotation. Despite this, some compounds on a total of 48 437 annotations were not found in ESI-FTICR MS spectra (table 3S). This could be due to the 438 presence of residual salts or to an important number of ions that led likely to ion suppression 439 and ion competition effects, despite the sample desalting through solid phase extraction. In the 440 441 attempt to overcome these effects, experiments based on direct introduction MALDI-FTICR MS based on dried droplet deposition were performed and ionization in the two sources 442 443 compared.

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3.2 Optimization of a direct introduction MALDI-FTICR-MS method for a non targeted metabolomic approach

In ESI measurements samples are commonly injected with a constant flow by direct infusion. 447 This translates likely in constant scan-to-scan ion abundance transmitted to the ICR cell, to 448 449 reduced error on exact mass measurement and eventually, to good reproducibility of ion intensity in repeated measurements. In contrast, traditional MALDI sample preparation based 450 on the "dried droplet" deposition has as main drawback an inhomogeneous distribution of 451 analytes and matrices crystals in the deposed sample [62]. This represents a problem for 452 quantitative analysis and, in the case of FTICR MS measurements, it can affect the 453 454 reproducibility due to a change of scan-to-scan ion abundance transmitted to the ICR cell. In order to evaluate ESI and MALDI for a non-targeted metabolomic approach based on FTICR 455 456 MS, repeatability was evaluated by calculating the relative standard deviation (RSD) on 457 absolute signals intensity within three intra-day acquisitions of 50 accumulated scans for each 458 mass spectrum. Results in ESI-FTICR MS mode obtained for P. sativum RE (SPE) samples 459 showed that reproducibility of ion signals for the 85% of the features in the m/z range 98-1500 460 was found appropriate, with deviation typically below 10%. Moreover, most metabolites showed RSD lower than 20% (Figure 2a). For the evaluation of reproducibility in intra-day 461 462 MALDI-FTICR MS measurements on dried droplet deposed samples for non-targeted metabolomics, 50 scans accumulated spectra were first recorded without any supervision on 463 the scan-to-scan ion abundance transmitted to the ICR cell during acquisition. Figure 2b 464 shows the obtained RSD for MALDI features in unsupervised measurements: only 20% of the 465

features were found to have a 10% RSD and 77% below the 20%, while RSD up to 60% 466 characterized a greater number of features. In order to minimize the variation of ion 467 abundance in the ICR cell during the acquisition and to improve reproducibility in repeated 468 measurements, an optimization of the selective accumulation was performed. 50 scans 469 470 accumulated spectra were recorded using different ranges of selective accumulation. Selective accumulation allows to set a minimum (min) and a maximum (max) of intensity [97]. Mass 471 spectra out of this range are discarded from the final average mass spectrum. Three ranges of 472 selective accumulation were tested. A first range with min intensity 5×10^7 and max 5×10^8 , a 473 second range at min 1×10^8 and max 5×10^8 and a third range at min 1×10^8 and max 3×10^8 . 474 Figure 4S shows the profiles of accumulation on the total acquisition obtained from scan-to-475 476 scan total ion current entering in the ICR cell and considered for final spectrum, during a total 477 of 50 scans. In general, more the range of selective accumulation was narrow, more the total 478 ion current resulting from accumulation assumed a linear trend, reducing progressively the "wavy trends" corresponding to low signal accumulation scans, as showed in figures 4Sb and 479 480 4Sc. Figure 4Sd shows that an ideal linear trend was obtained when selective accumulation spanned from a min of 1×10^8 to a max of 3×10^8 for each accumulated scan. It is worth to note 481 482 that the lower limit influenced the signal threshold and its optimization allowed to discard acquisition scans corresponding to low density zone on the MALDI spot in which only signals 483 of the noise were present. In this regard min value at 5×10^7 led to the accumulation of spectra 484 in which no signal corresponding to metabolites were present. While, the value of min 485 selective accumulation equal set to 1×10^8 allowed to obtain total ion signal in the mass 486 spectra in the $9 \times 10^6 - 1 \times 10^7$ range. Similarly, the optimization of the max limit avoided 487 accumulation of too many ions in "hot spots". It is worth to note that the overall scan-to-scan 488 intensity with optimized ranges corresponded to an effective min intensity of 1×10^7 to a max 489 490 effective intensity of 3×10^8 in mass spectra. This range corresponded to the intensity variation 491 in one ESI mass spectrum, allowing a better comparison of final spectra acquired with the two ion sources. The optimization of the selective accumulation range resulted in the overall 492 493 increase of mass spectra reproducibility and in a higher mass precision. In fact, RSD with 494 MALDI reached satisfying values approaching results obtained with ESI. Figure 2c shows that with optimized ranges, 52% of metabolites had RSD below 10% and 93% in the 20% 495 limit. Similarly, the standard error over a m/z 98-1500 range was reduced from 0.150 ppm in 496 the unsupervised analysis to 0.080 ppm using the optimized selective accumulation ranges 497 These results represented an improvement towards a reliable analytical method based on 498 classical deposition method for MALDI-FTICR MS applied to metabolomic analysis, 499

especially for the confident formula assignment in presence of high atomic diversity 500 Nonetheless, it must be noted that, several scans were discarded yielding to an increase of 501 analysis time up to 150%. For instance, for 200 accumulated scans, the run time was around 5 502 min with unsupervised analysis and up to 12 to 15 min with the optimized selective 503 504 accumulation range. Optimization was performed on a same spot containing DHB mix with the sample in proportion 1:10 + 0.1% FA. The laser power was optimized for all matrices in 505 506 order to get comparable ionization thresholds, the optimized range of selective accumulation fitted with all other conditions. 507



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Fig. 2: Relative standard deviation of signal intensity calculated for common metabolites on n=3 replicates found in Pisum Sativum RE for a) direct introduction ESI-FTICR MS, b) MALDI-FTICR MS without optimization of the selective accumulation and c) MALDI-FTICR MS under optimized conditions laying in a selective accumulation range of min=1×10⁸ and $max=3\times10^{8}$.

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515 **3.3 Evaluation of the efficiency of different MALDI matrices**

In order to perform MALDI-FTICR MS analysis in best conditions for non-targeted 516 metabolomic aims, an optimization of the most suited sample/matrix combination was 517 performed. P. sativum RE SPE samples were mixed with the 6 matrices selected in this study 518 at a ratio 1:1, 2:1 and 1:10. As ESI-FTICR MS measurements in positive mode were 519 520 performed on acidified solutions to favor protonated forms against Na⁺ and K⁺ adducts, the three sample/matrix ratio for each matrix were also tested with the addition of 0.1% FA. For 521 negative mode, the mixtures sample/matrix were used without any further addition. Solutions 522 523 were deposed using the "dried droplet" method, dried under vacuum and analyzed through MALDI-FTICR MS. Mass spectra for the 24 conditions in positive mode and nine conditions 524 525 in negative mode were acquired using the optimized selective accumulation range for 50

accumulated scans. Mass spectra were treated as previously described based on the three-steps 526 procedure including internal calibration, blank subtraction and molecular formula assignment. 527 The optimization of the best condition for each matrix was performed at an early stage of the 528 529 study, the criteria for best condition selection was fixed to the higher number of common m/zvalues found in ESI- and MALDI-FTICR MS spectra and on the highest number of features 530 obtained in order to catch the maximum of detected features for a non-targeted metabolomic 531 study (Figure 3). As alignment based on m/z values is performed before molecular formula 532 assignment, isotopic peaks were counted in the total number of peaks. Nonetheless, 533 534 comparative analysis for the different conditions could be still indicative of the best matrix conditions. For instance, among the six conditions tested for DHB, the ratio sample:matrix 535 1:10 with the addition of 0.1% FA led to 626 common peaks with ESI-FTICR MS spectra and 536 to a higher number of detected m/z values, while the other ratios using DHB were 537 538 characterized by lower numbers. This led finally to select for further MALDI non-targeted metabolomic investigations in positive mode, the DHB matrix the ratio 1:10 + 0.1% FA, for 539 α -CHCA the ratio 2:1 + 0.1% FA, for ScA and DCTB the ratio 1:1 + 0.1% FA. Moreover, an 540 inspection of the histograms highlighted the presence of a relatively high number of peaks 541 542 which were exclusively detected in MALDI spectra. These additional molecular formulas 543 could arise both from the presence of multiple adducts formed and/or to additional metabolites for which detection was preferred in MALDI-FTICR MS mode (discussion in the 544 545 next paragraph). Based on the number of common peaks, the global ionization of the sample in MALDI-FTICR MS was obtained in the order DHB > α -CHCA > ScA > DCTB in positive 546 mode. In fact, the ratio of common peaks on the total m/z detected in ESI-FTICR MS spectra 547 (4231) was respectively 14.7%, 11.3%, 6.9% and 5%. Nonetheless, it must be considered that 548 in presence of residual salts especially in ESI, the total m/z detected do not correspond 549 550 necessarily to a corresponding number of unique features and that one compound may be 551 present in form of multiple adducts.

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Fig. 3. Evaluation of the total number of peaks and the common peaks found in common with ESI-FTICR MS spectra at different ratio sample/matrix for a) DHB, b) α -CHCA, c) ScA and d) DCTB in MALDI-FTICR MS spectra acquired in positive mode. Best ratios are highlighted in bold style. Venn diagram obtained from alignment of m/z lists for the four selected conditions (DHB 1:10 + 0.1% FA, α -CHCA 2:1 + 0.1% FA, ScA and DCTB 1:1 + 0.1% FA) and for the two highest ranked matrices (DHB 1:10 + 0.1% FA, α -CHCA 2:1 + 0.1% FA, with ESI-FTICR MS spectra are showed respectively in e) and f).

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This can explain the surprising low percentage found for common peaks in ESI- and MALDI-562 563 FTICR MS spectra at this stage. A discussion on the number of common features obtained for ESI and MALDI after molecular formula assignment is presented in the following paragraphs. 564 565 In general, a great conformity was found for all tested matrices, as the Venn diagram obtained from alignment of the four best conditions showed the presence of many common m/z values, 566 567 even when two matrices of different chemical nature were compared. Only ScA was characterized by a high number of additional peaks (1420) respect to ESI which were not 568 either in common with other matrices used in MALDI (Figure 3e). Nonetheless, DHB and α -569 570 CHCA obtained the highest score when compared with ESI and between the two, DHB seemed to be the most appropriate for non-targeted metabolomics applications. It must be 571

572 noted that these results considered only the number of common peaks but did not take into 573 account any information on the type of metabolites, on their intensity or on their detection in 574 form of different adducts. All these concepts will be developed more in the following 575 paragraphs.

MALDI in negative mode resulted in poor metabolites detection (Figure 5S) and low number 576 of common features with ESI spectra (Figure 6S) in respect to positive mode (Figure 3). In 577 fact, alignment in negative mode should be more indicative, as compounds were detected in 578 ESI spectra preferentially as deprotonated forms, removing data redundancy experienced in 579 580 positive mode. The best ratios sample / matrix were for 9AA 1:1, for DAN 2:1 and for DCTB 1:1. In these conditions, the ratio of common peaks on the total of total m/z detected in ESI in 581 582 negative mode (1987) was 5.2% for 9AA, 6% for DAN and 4.3% for DCTB. In conclusion, spectra in ESI negative mode were very informative and easy to study thanks to the absence 583 584 of adducts. In comparison, MALDI negative mode did not bring substantial further information in the case of RE of P. Sativum. As a contrary, results in MALDI positive mode 585 586 were highly complementary to the results in ESI positive mode. As a consequence, the negative mode in MALDI was not further investigated in this study and the following 587 588 discussion will be focused on the non-targeted metabolomic approach in positive ion mode. Nonetheless, MALDI FTICR MS in negative mode should not be discarded a priori and 589 590 further studies could be carried out with other matrices.

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592 **3.4** Comparison of ESI-FTICR MS and MALDI-FTICR MS for non-targeted 593 metabolomics on *Pisum sativum* root exudates

Once best conditions for MALDI ionization parameters and best ratios sample/matrix 594 595 obtained, experiments were repeated for the selected conditions accumulating a higher number of spectra (200 accumulated scans). Measurements performed in triplicates were 596 597 obtained from three different spots for each condition. Selected conditions for MALDI nontargeted metabolomics on P. sativum RE were for DHB analyte/matrix ratio of 1:10 and 0.1% 598 FA, for α-CHCA analyte/matrix ratio of 2:1 and 0.1% FA, for ScA analyte/matrix ratio of 1:1 599 with 0.1% FA. Comparison was possible with ESI spectra as, scan-to-scan accumulation, total 600 601 number of scans and final intensity resulted comparable (Figure 4S). Internal calibration, blank subtraction and molecular formula attribution were performed as previously stated. 602

Figure 7S shows a comparison of the absolute intensity of selected features in ESI andMALDI with the three different matrices. The ionization efficiency towards six main families

were then compared. The six families were nucleosides (Figure 7Sa), amino acids and 605 oligopeptides (7Sb), phosphocholines and phosphoserines (7Sc), fatty acids (7Sd), fatty acid 606 amides containing histidine (7Se) and terpenes (7Sf). For each family, a number ranging from 607 608 six to nine metabolites were selected according to the presence of a hypothesis of structure 609 raising from DDA-MS measurements or, for assimilation to a chemical family, according to the molecular formula obtained from the ESI measurements. Error bars are relative standard 610 deviation on the three replicates intensities obtained from three different spots. An analysis of 611 the different chemical families allowed to retrieve the presence of particular ionization trends. 612 613 For example, for all the studied nucleotides (Figure 7Sa), a better ionization yield was obtained in MALDI using α -CHCA as matrix, with an increase of absolute intensity up to 614 250% respect to the trace obtained in ESI. Conversely, DHB and ScA resulted less efficient in 615 the ionization of nucleosides, leading to lower absolute intensities for the studied metabolites, 616 when compared to ESI. For amino acids and oligopeptides (Figure 7Sb), the number of 617 nitrogen atoms (N) in the molecule resulted crucial in the intensity yield. In fact, for low N 618 number as for phenylalanine (Figure 7S-1b) or for oligopeptide with $N \le 4$ (Figure 7S-2b, -3b, 619 -4b) ESI resulted in higher signal intensities, while MALDI with DHB matrix enabled a very 620 efficient detection of features containing N \geq 5. Moreover, α -CHCA led to higher absolute 621 intensity for oligopeptides containing four to five N. In general, DHB was found to be the 622 most suited matrix for oligopeptides with a signal increase respect to ESI up to 116 % and 85 623 % respect to α -CHCA. Fatty acids were preferentially ionized and detected in ESI (Figure 624 7Sd). All fatty acids features were detected in MALDI, but at relatively low intensity. 625 Triterpenes analyzed in the measurements included compounds as soyasaponin di-glucosides. 626 Soyasaponins (Figure 7Sf) showed good ionization yield in MALDI with DHB matrix and in 627 628 less extent also with α -CHCA. Though, it must be noted that in ESI soyasaponins were ionized as protonated and Na adducts at comparable extent, while in MALDI, even with the 629 addition of a 0.1% FA in the sample/matrix solution, the only adducts were the Na forms. 630 Figure 7Sf shows therefore a comparison of intensity for Na adducts formed in the two 631 sources. In the case of phosphocholines and phosphoserines (Figure 7Sc) and of fatty acid 632 633 amides containing histidine (Figure 7Se), it was not possible to retrieve a global trend of ionization. For these chemical classes, preferential ionization seemed to be strongly dependent 634 635 on the peculiar chemical structure. MALDI spectra obtained using ScA showed a preference for the ionization of oligopeptides, alkaloids and for some phosphocholines, but in general, 636

637 signals remained of poor intensity and showed therefore no major interest in non-targeted638 metabolomic approaches.

In general, independently from the matrix, ionization in MALDI appeared to be preferred for molecules containing high number of nitrogen atoms and to increase with the presence of conjugate systems, as in the case of nucleotides. This hypothesis was first been made thanks to rationalization of ionization yield for the metabolites annotated through DDA-MS measurements. In order to deeply investigate this aspect, after molecular formula assignment, the number of features (#) containing N atoms spanning from zero to eight was counted for ESI and for MALDI with DHB, α -CHCA and ScA and plotted as histogram (Figure 4a).

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Fig. 4: a) Histograms showing the number of detected features containing from one to eight atoms of nitrogen in ESI (orange), MALDI DHB (green), MALDI a-CHCA (purple) and MALDI ScA (yellow); b) and d) show respectively the DBE vs #C plot and the van Krevelen diagram obtained from molecular formula assignment of ESI (orange) and MALDI (blue) obtained from the three matrices (DHB, a-CHCA and ScA) spectra; c) total number of assigned molecular formulas (green) and adducts (orange) together with the distribution of

features containing CHO (light blue), CHNO (red), CHNSO (yellow) and CHNPO (blue)atoms.

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The molecular formula assignment revealed that effectively an increase of the number of 657 658 features containing N was obtained with MALDI even if intensity for low number of N atoms resulted lower than in ESI, as previously stated (Figure 7S). On the other side, number of 659 oxygen atoms (O#) seemed to have less effects on ionization via MALDI (Figure 8S), and a 660 more relevant increase of features containing O# from two to four could be experienced 661 probably as mirror of a higher N# in the molecules. These results agreed with the trends of 662 relative intensity (%) at different N# and O#, for which histograms are showed in figure 9Sa 663 664 and 9Sb, respectively.

Moreover, the double bond equivalent (DBE) and the carbon number (C#) were calculated 665 666 from each assigned molecular formula for both ESI and MALDI, gathering together all features obtained from the three matrices (all MALDI). The resulting plot in Figure 4b shows 667 that effectively, additional features detected for the first time through MALDI were generally 668 characterized by higher DBE, up to 25, which corresponded to oligopeptides with N from six 669 to eight. This highlighted that, ionization for unsaturated and high N# molecules was 670 preferred in MALDI while ESI resulted in the preferential ionization of lower DBE 671 compounds. The presence of additional features appeared surprising because MALDI spectra 672 were characterized by simpler profiles respect to ESI spectra, while the obtained van Krevelen 673 diagram showed great similarity (Figure 5). 674





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Fig. 5: Mass spectra obtained in positive mode and related van Krevelen diagrams for Pisum
sativum root exudates obtained from molecular formula assignment based on ultra-high-

679 resolution a) ESI-FTICR MS and MALDI-FTICR MS with b) DHB, 2,5-dihydroxybenzoic
680 acid, c) α-CHCA, α-Cyano-4-hydroxycinnamic acid and d) ScA, Sinapinic acid for the SPE
681 desalted P. sativum RE sample.

682

This mirrored both low signals for some metabolites and both a lower number of Na⁺, K⁺ and 683 Ca²⁺ adducts. In fact, after molecular formula attribution, most of the features found in 684 MALDI corresponded to protonated forms, while adducts were much less represented (Figure 685 4c). As an example, feature **35** at m/z 211.1325, corresponding to molecular formula C₁₂H₁₈O₃ 686 (Table 3S) and annotated via DDA-MS as the plant hormone jasmonic acid (annotation level 687 2), was detected in ESI as Na⁺, K⁺ and Ca²⁺ adducts, while in MALDI only the protonated 688 form was found. Together with additional features, spectra obtained with MALDI showed 689 common metabolites with ESI. Nonetheless, because of wide differences in ionization, it was 690 691 difficult to evaluate the correct number of metabolites successfully ionized in both sources (as protonated or adducts) and, counting only the protonated forms, for all matrices around 10% 692 693 of features were found to be in common. A list of metabolites found in ESI, MALDI (DHB) and MALDI (α -CHCA) can be found as supplementary material. Examples of additional 694 features corresponding to potential metabolites which were detected for the first time in P. 695 696 sativum RE thanks to MALDI were features at m/z 152.056675 (C5H5N5O, proposed identification guanine), m/z 156.076770 (C₆H₉N₃O₂ proposed identification histidine), m/z 697 166.072361 (C₆H₇N₅O proposed identification methylguanine). The increase in the number of 698 metabolites detected in MALDI corresponded to small metabolites, but also to molecules with 699 700 higher m/z that are consistent to triterpenes and oligonucleotides as features at m/z328.284593 (C₁₉H₃₇NO₃, proposed identification palmitoyl alanine), m/z 455.351968 701 702 (C₃₀H₄₆O₃, proposed identification moronic acid) or *m/z* 740.340207 (C₃₉H₄₅N₇O₃, proposed 703 identification cyclo[His-Tyr-Tyr-Leu-Tyr]). Features that were exclusively detected in 704 MALDI are highlighted in bold style in supplementary materials.

Figure 4d shows the van Krevelen diagram obtained from molecular formulas obtained using 705 ESI and MALDI with all matrices. It is worth to note that additional features are not likely to 706 come from MALDI in-source fragmentation as the laser power and the number of shots were 707 708 optimized for each matrix/sample mixture in order to be just slightly above the matrix 709 ionization threshold. Moreover, the presence of the same additional metabolites in the spectra 710 obtained from two distinct matrices represents an additional proof of the selective detection in MALDI mode. Nonetheless, it should be considered that in non-targeted metabolomic, the 711 different nature of the metabolites could lead to different behaviors of chemical classes in 712

presence of the matrix, and a complete absence of fragmentation cannot be excluded *a priori* without further investigation. Anyway, results obtained herein shows that MALDI enabled a wide detection of compounds of different chemical classes, and it confirmed its potential as a complementary technique to ESI for a non-targeted metabolomic approach on biological samples.

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719 3.5 Salt tolerance and matrix effects in ESI and MALDI

In order to evaluate salt tolerance of ESI and MALDI techniques for non-targeted 720 721 metabolomics, mass spectra were recorded for a series of P. sativum RE SPE solutions which 722 were spiked with various salt amounts. Indeed, in order to simulate the release of salts in 723 hydroponic cultures, solutions were spiked with aliquots of Hoagland solution [98]. The last is a mixture of many salts for which the concentration is normally expressed in terms of 724 725 electrical conductivity (EC, dS m^{-1}), which depend on the metal content [99]. For example, $\frac{1}{2}$ Hoagland solution has EC of ~ 1.1 dS m⁻¹, which for scale comprehension, corresponds to a 726 concentration of ~ 10 mM NaCl, at pH=7 [100]. It is worth to note that, during the collection 727 of the sample, a part of salts can be released together with the metabolites, but at any extent, 728 the concentration should exceed the initial Hoagland EC used for plant growth. Series of 729 solutions for measurements in the two sources were therefore prepared by adding a ¹/₄ 730 Hoagland solution at 0.01%, 0.05%, 0.1%, 0.5%, 1%, 5% and 10% on the final sample. Salt 731 ranges were chosen starting from a minimum equivalent salinity ~ $6 \mu M$ NaCl up to ~ 0.6 mM732 NaCl corresponding to the addition of 10% 1/4 Hoagland solution. Measurements were 733 performed in triplicates both for ESI and MALDI. For MALDI, the DHB matrix was selected 734 because of its suitability for non-targeted metabolomic study as demonstrated before. In fact, 735 736 even if α -CHCA led to higher intensity for many metabolites, DHB resulted in the 737 simultaneous detection of many chemical classes. The variation of the absolute intensity of four case compounds belonging to different chemical classes, namely fatty acids, 738 oligopeptides, soyasaponin triterpenes and nucleosides, at increasing salt concentrations is 739 740 shown in Figure 6a for ESI and Figure 6b for MALDI.

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Fig. 6: Variation of the absolute intensity of four compounds of interest at increasing salt concentrations in a) ESI and b) MALDI. Salt concentration is expressed in terms of % of the Hoagland solution volume added to the sample (at log_{10} scale). Matrix effect expressed as $[(I_{ME}/I_{SPE})/I_{SPE} \times 100]$ in function of the salt addition for the four case metabolites in ESI and MALDI are showed in panel c. Error bars calculated as standard deviation on three repeated measurements are also shown.

749 The protonated form for m/z 367.1865 C₁₈H₂₆N₂O₆ (annotated as fatty acid amide containing urocanate), m/z 728.3407 C₃₈H₄₅N₇O₈ (annotated as an oligopeptide), m/z 268.1040 750 $C_{10}H_{13}N_5O_4$ (annotated as adenosine) and the sodium adduct for feature at m/z 943.5270 751 C₄₈H₇₈O₁₈ (annotated as soyasaponin) were chosen for comparison of the two sources. Two 752 753 distinct trends were observed in the two sources with the increase of salt concentration. In fact, while in ESI a ~ 6-fold signal drop was measured at salinity 10% for all compounds 754 755 (Figure 6a), the opposite trend was obtained in MALDI (Figure 6b). Not only the intensity yield for all the ions remained mainly constant up to 0.5% Hoagland, but surprisingly, salts 756 757 addition had a positive matrix effect on ionization in the range 0.5%-5% leading to a significant increase of the absolute intensity for all ions. Nonetheless, at Hoagland 758 concentration higher than 5%, salt tolerance in MALDI was the optimum while at higher 759 760 values the ion intensity decreased.

Nevertheless, the mere comparison of the absolute intensity for the case metabolites in the two sources can give only an idea on matrix effects at increasing salinity. For this reason, matrix effects in each source separately were further assessed by comparison of the peak intensity for the studied compounds in the spiked samples and in the starting SPE desalted sample which was used for salt tolerance. Matrix effect was then calculated according to Stahnke et al. [101] as:

Matrix effect (%) =
$$\frac{I_{ME} - I_{SPE}}{I_{SPE}} \times 100$$

 I_{ME} is the intensity of a metabolite in the desalted SPE sample spiked with increasing salt 768 amounts and I_{SPE} is the intensity of the same metabolite in the desalted SPE sample (with any 769 addition of salts). The intensities were retrieved from the mass spectra obtained in ESI and 770 MALDI for both desalted samples and spiked samples. In fact, assessment of matrix effects is 771 usually performed using an analytical standard of known concentration analyzed in the same 772 773 conditions. However, as concentration of the investigated compounds was not known in this 774 study, the starting solution obtained through SPE before spiking was considered as a standard. 775 It must be noted that this constituted an idealization as ion charge effects due to the sample 776 complexity could influence as well the ionization of compounds in the SPE sample. Nonetheless, as the same SPE sample was used for spiking, the same complexity was kept 777 778 into account when comparing spectra obtained with the same source. With the proposed formula, matrix effect values higher than 0 % described an increase of the signal in the spiked 779 780 samples respect to the desalted sample, and therefore they were interpreted as signal enhancement. Similarly, values lower than 0 % denotated signal suppression. Figure 6c shows 781 the obtained matrix effect (%) for four metabolites belonging to the different chemical classes 782 in the two sources at increasing salinity. Signal suppression of around 50 % were obtained in 783 ESI when passing from 0.01 to 1% salt concentration and at maximum salinity (10% salts) 784 matrix effect accounted to 70-80%. Contrarily, strong signal enhancements were obtained in 785 MALDI with matrix effects accounting up to +150%. This mean that salt concentration equal 786 to a 5% of the total sample volume would triple signal intensity for selected ions. Effectively, 787 as signal enhancement obtained in MALDI resulted to be higher than signal suppression in 788 789 ESI, it could be likely that for a same compound, a significative overtake of S/N in MALDI respect to ESI was experienced. It is worth to note that matrix effect does not affect all the 790 compounds at the same extent. For example, in MALDI, metabolites with high N number as 791 m/z 728.3407 C₃₈H₄₅N₇O₈ and m/z 268.1040 C₁₀H₁₃N₅O₄ showed an absolute intensity drop 792 already at 1% Hoagland concentration (Figure 6a). Ionization enhancement at high salt 793

concentration has been already showed in previous studies [102,103] and it has been explained 794 as the result of the fast precipitation of salt crystals during evaporation respect to matrix-795 sample co-crystallization, which would decrease their location on the surface and favor their 796 emplacement at the border of the spot. In the case of this study, ionization enhancement could 797 be due to the peculiar nature of the Hoagland solution and the contained metals. In this extent, 798 three different mechanisms can be considered : 1) the presence of a chelator in the Hoagland 799 solution, namely EDTA (Table 1S), which would lead to the chelation of other metals and to 800 their unavailability in forming adducts with the metabolites of the sample [104]; 2) the 801 802 ionization of DHB matrix ions containing two aromatic carboxylic acid as adducts, which would reduce the ionization of matrix cluster and lead to an increase of solubility in water 803 804 (contained in the RE sample and in less extent in the matrix solution), and eventually to a 805 better analyte incorporation and homogeneity [105]; or 3) as already studied adducts can 806 competitively binds with anionic analytes, favoring their desorption and reducing chemical 807 noise [106].

- Likely, the improvement of the observed S/N for the metabolites in this study could be explained as the combination of the three factors.
- 810

811 **3.6 MALDI-FTICR MS applied to a true lyophilized** *Pisum sativum* **RE sample**

The proposed method based on MALDI for non-targeted metabolomic analysis of P. sativum 812 RE has been optimized and evaluated on a metabolite fraction obtained through solid phase 813 814 extraction. This constituted a simplified sample in which, together with metabolite extraction, 815 a reduction of salts was performed. In most cases, solid phase extraction needs to be optimized for each sample and it represents a long and laborious process which is time-816 817 consuming. Moreover, together with salt elimination, the loss of the most polar metabolites can be experienced. As RE contain normally a high number of polar metabolites, 818 819 lyophilization would lead to a less biased description of the real sample composition, at the expense of a higher salt concentration. For this reason, in order to evaluate the performances 820 of the optimized non-targeted metabolomic approach based on MALDI on high salt 821 concentration RE sample, measurements based on MALDI and on ESI were performed on a 822 823 lyophilized P. sativum RE sample. Mass spectra were acquired, under the same experimental conditions previously used. From preliminary analysis, lyophilized samples resulted in a 824 higher number of K⁺ and Na⁺ adducts, while Ca²⁺ adducts represented sporadic cases. For this 825 reason, Ca²⁺ was not considered in molecular formula assignment. Repeatability evaluated by 826

aligning the list of m/z values extracted at relative intensity threshold higher than 0.2 %, led to values of 80 % match for ESI, 78 % match for a-CHCA, 76 % for DHB in MALDI measurements. Molecular formulas were attributed accordingly to what was done for SPE desalted samples.



Fig. 7: *a*) van Krevelen diagram obtained from formula assignment of ESI (orange), MALDI with DHB (green) and a-CHCA (violet) for P. sativum RE lyophilized samples. *b*) Overlap of signals traces (ESI, orange; DHB, green; a-CHCA, violet) for two m/z values corresponding to case compounds which were detected only in MALDI. *c*) Relative intensity of features containing from 1 to 8 atoms of nitrogen in ESI (orange), MALDI DHB (green), MALDI a-CHCA (violet) and MALDI ScA (yellow).

Figure 7a shows the van Krevelen diagram arising from formula assignment on spectra 838 839 obtained with the two sources for the lyophilized sample. As expected, a higher number of assigned formulas was globally detected respect to the desalted sample obtained through SPE 840 841 (Figure 3a), highlighting that desalting led effectively to the loss of part of the metabolites. Among these, a portion of features at O/C higher than 0.5 appeared, highlighting the recovery 842 of a higher proportion of polar metabolites. These molecules could correspond to nucleoside 843 phosphates, cyclic nucleotides, amino acids and glucoside flavonoids. The list of assigned 844 845 molecular formula for the lyophilized sample in ESI and in MALDI measurements with DHB and a-CHCA can be found as supplementary information. In general, molecular formula 846 847 assignment confirmed previous results, as a higher number of adducts was assigned in ESI compared to MALDI spectra also for the lyophilized sample (Figure 10Sa). 848

Figure 7b shows the overlap of relative signal intensity obtained for two case metabolites in 849 the two sources, namely $C_5H_5N_5$ with $[M+H]^+$ at m/z 136.06178 annotated as adenine and 850 $C_{38}H_{45}N_6O_7$ with [M+H]+ at m/z 728.34036 annotated as an oligopeptide containing proline. 851 While poor intensity signals for the two metabolites characterized ESI spectra, MALDI with 852 both matrices led to higher S/N signals enabling their efficient detection and eventually, 853 confident molecular formula assignment. Effectively, high salinity leading to ion suppression 854 in ESI and ion enhancement in MALDI improved the detection of features in MALDI. This 855 was especially valid for the DHB matrix that showed a strong signal enhancement compared 856 857 to ESI. These findings agreed with the evolution of ion intensities at the increase of salt 858 concentration presented in the previous paragraph (Figure 6) and allowed also to retrieve the 859 approximative salinity, which was evaluated to be around 2% (v/v) in lyophilized P. sativum RE. At this salt concentration, some metabolites were not detected in ESI but on average a 860 861 higher number of detected features was obtained compared to MALDI (Figure 7a). Nonetheless, as previously stated, the total number of assigned formulas was redundant in ESI 862 863 measurements because of the presence of several adducts. The Venn and van Krevelen diagrams were then plotted considering only the protonated forms in ESI and MALDI (Figure 864 865 11S). In this case, similar plots were obtained, except for fatty acids and lipids (H/C=1.5-2 and O/C=0.1-0.3), which showed to be the most affected from adduct formation (Figure 866 10Sb). On the other side, a lower number of formulas only detected in ESI was obtained, 867 keeping the number of common formulas almost unchanged (Figure 10Sb). Trends of relative 868 869 intensity and number of detected features containing increasing N# and O# (showed respectively in figure 7d, 7d and 11Sa, 11Sb) confirmed results obtained for the SPE desalted 870 sample. The two sources appeared to be highly complementary for a non-targeted 871 metabolomic approach on root exudate samples. MALDI enabled an increase of detected 872 features especially at relatively high salt concentration. Most of the metabolites exclusively 873 874 detected with MALDI corresponded to nucleosides, alkaloids, flavonoids and highly aromatic compounds such as triterpenes and riboflavin analogues. For example, the exclusive detection 875 876 in MALDI measurements was experienced for metabolites which molecular formula that could be tentatively assigned to quercetin analogues (m/z C₁₅H₁₀O₇), lumichrome (m/z877 $C_{12}H_{10}N_4O_2$), lumiflavine (*m/z* $C_{13}H_{12}N_4O_2$), willardine (*m/z* $C_7H_9N_3O_4$) and anhydropisatine 878 $(m/z C_{17}H_{12}O_5)$. These molecules have a biological importance and they have been found to 879 cover a principal role in P. sativum metabolism or to represent important mediators in plant 880 growth and interaction with microorganisms [107–110]. 881

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4. Conclusion

In this study, a non-targeted metabolomic approach via direct introduction MALDI-FTICR 885 MS based on dried droplet deposition, was optimized on *P. sativum* root exudate samples. 886 Optimized conditions of selective accumulation and best sample:matrix ratio for different 887 matrices enabled improved precision and high metabolite cover up increasing the number of 888 detected unique features compared to ESI-FTICR MS analysis. Moreover, matrix effect 889 890 evaluation performed on RE spiked with salt showed the presence of ion suppression in ESI-891 FTICR MS and ion enhancement in MALDI-FTICR MS. Spectra obtained with MALDI were characterized by a lower complexity and led to an increase of detected unique features as a 892 893 mirror of both lower number of adducts and preferential ionization of compounds at high N# and high DBE. Lyophilized root exudate samples analyzed through the two sources showed a 894 895 good coverage of metabolite detection and annotation thanks to the ultra-high resolution, mass measure precision and dynamic range of FTICR MS, demonstrating that MALDI could be an 896 897 alternative and complementary source for non-targeted metabolomics on biological samples. The authors believe that the results of this work are relevant in the field of non-targeted 898 899 metabolomic and in the analysis of root exudate using a direct introduction approach based on 900 FTICR MS. Moreover, the proposed method via direct introduction MALDI FTICR MS based on classic dried droplet deposition could be applied to other type of samples which are 901 affected by matrix effects due to the presence of salts such as DOM and NOM in seawater, 902 humic substances in fresh soil or in other biological samples as algae or blood. However, 903 future works still require addressing some unresolved questions as for example, the 904 optimization of an efficient MALDI FTICR MS method for RE analysis in negative mode or 905 906 the research of new and more performant matrices for improved metabolite detection, sample 907 homogeneity and high reproducibility for RE analysis. In this extent, solid-ionic or liquidionic matrices represent potential candidates for RE analysis through MALDI FTICR MS 908 thanks to their co-crystallization properties and the possibility to be used both in positive and 909 910 negative mode [111]. Moreover, future investigation should be dedicated also on defining the applicability and the limits of the optimized conditions found in this study on plants belonging 911 912 to different genus and/or family or to study the RE changes in presence of rhizobacteria in the pursuit of a universal method based on MALDI FTICR MS for a comprehensive RE analysis. 913

914 Author contribution: Valentina Calabrese: Conceptualization, Data curation, Formal
915 analysis, Investigation, Methodology, Visualization, Roles/Writing - original draft Isabelle

Schmitz-Afonso: Conceptualization, Funding acquisition, Project administration, Resources,
Supervision, Validation, Writing - review & editing Wassila Riah-Anglet: Methodology,
Writing - review & editing Barbara Pawlak: Funding acquisition, Project administration,
Resources, Writing - review & editing Isabelle Trinsoutrot -Gattin Funding acquisition,
Project administration, Methodology, Resources Carlos Afonso: Conceptualization, Funding
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Data availability All the data are described within the manuscript. The raw data and metadataanalyzed during the current study are available from the corresponding author on request.

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- 945
- 946
- 947 **References**

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