Quantitative profiling of 1-Carbon Metabolites, Amino Acids and Precursors, and Plasmalogens in human plasma using Ultra-High-Pressure Liquid Chromatography coupled with Tandem Mass Spectrometry and robotic compound extraction Stephanie Andraos¹, Michael Gov¹, Ben Albert¹, Martin Kussmann^{1, 2}, Eric B.

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14 Abstract (80 to 250 words)

15 Amino acids (AAs) and one-carbon (1-C) compounds are involved in a range of key metabolic

16 pathways, and mediate numerous health and disease processes in the human body.

17 Previous assays have quantified a limited selection of these compounds. Here, we describe

18 an analytical method for the simultaneous quantification of 37 1-C metabolites, amino acids,

19 precursors, and plasmalogens using reversed-phase ultra-high pressure liquid

20 chromatography coupled with tandem mass spectrometry (UHPLC-MS/MS). Compound

21 extraction from human plasma was tested manually before being robotically automated.

22 The final analytical panel was validated on human plasma samples. Our automated and

23 multiplexed method holds promise for application to large cohort studies.

24 1. Introduction

25 In the 1930s, Donal Van Slyke and Robert Dillon were some of the first scientists to develop

- a method for the analysis of free amino acids using crude analytical methods (1). Since then,
- 27 the comprehensive analysis of low-molecular weight metabolites (*i.e.* metabolomics) has
- 28 progressed thanks to advanced technology, in particular the coupling of chromatography
- and mass spectrometry, to enable their accurate quantitation in biological samples (2,3).
- 30 Several metabolomics methods have been developed for amino acids and/or 1-C
- 31 metabolism compound quantification in different body fluids (*e.g.* plasma, cerebrospinal
- 32 fluid, red blood cells) (4,5). However, on their own, each of these methods only quantifies a
- 33 limited selection of metabolites (4,5).

34 **1.1** Amino acids and 1-C metabolites in human health

- 35 Amino acids and 1-C metabolites are central to physiological processes in the human body
- 36 (*e.g.* nutritional metabolism, molecular, endocrine and neurological functions) (6). Due to
- 37 their ubiquitous involvement in biological processes, quantifying the concentration of amino
- acids and 1-C compounds in human plasma can inform on the physiological status of an
- 39 individual. Specific metabolic profiles have been linked to health and disease outcomes
- 40 (7,8). Estimating nutritional status using dietary reporting alone is unreliable (9). Therefore,

- 41 an objective quantitation of nutritional metabolites is of utmost importance, to strengthen
- 42 our current understanding of human physiology and nutritional metabolism.

43 **1.2** The use of human plasma for quantitative metabolomics

- 44 Plasma is the non-cellular component of human blood. As such, plasma contains virtually all
- 45 human proteins (*e.g.* blood clotting, binding proteins) representing those expressed
- 46 throughout the tissues in addition to glucose, vitamins, and other nutrients. Blood collection
- 47 from human subjects is relatively easy and non-invasive making it particularly appealing in
- 48 both clinical and research settings (10). In a healthy population, blood metabolites (e.g.
- 49 amino acids) typically maintain homeostatic levels when in a fasted state, but may fluctuate
- 50 substantially in the post-prandial state (11). Therefore, physiological extrapolations need to
- 51 be made cautiously when interpreting the results of plasma metabolomics studies, as these
- 52 reflect either states of homeostasis (in the fasted state), a postprandial response (in the fed
- 53 state), or metabolic exchanges between tissues. Notably, plasma-tissue correlations of
- 54 metabolites are not always reliable (11). For example, metabolites quantified in plasma are
- 55 typically not able to be assigned to cells or tissues of origin. However, an increasing level of
- 56 biological understanding of tissue-specific pathways has allowed for the development of
- 57 mathematical models, extrapolating organ-specific metabolite levels based on their plasma
- 58 measurements (12,13).
- 59 Here we present an automated method that combines a robotic extraction of plasma
- samples with reversed-phase ultra-high-pressure liquid chromatography coupled with
- 61 tandem mass spectrometry (UHPLC-MS/MS) to quantitate 37 1-C metabolites, amino acids
- 62 and precursors, as well as plasmalogens in a single plasma sample. This method has wide
- 63 applicability for metabolomic studies using non-invasive sample collection methods.

64 Materials and Methods

65 Ethics

- 66 Plasma samples used for method validation were obtained from the Fish Oil in Pregnancy
- 67 trial, approved by the Northern A ethics Health & Disabilities Committees (Trial number
- 68 17/NTA/154). Participants provided written informed consent, and the trial was conducted
- 69 according to the principles of the declaration of Helsinki.

70 Materials

71 Materials used throughout the experiment are detailed in Supplementary table 1.

72 Plasma sample collection

73 Whole blood was collected in lithium heparin and EDTA blood collection tubes. Plasma was 74 separated by centrifugation (1300 x g, $4^{\mathbb{B}}$ C, 15 min), then stored (-80^{\mathbb{B}}C).

75 Standard preparation and quality controls

- 76 A labelled amino-acid premix solution containing: L-Arginine:HCL (¹³C6, 99%; ¹⁵N4, 99%); L-
- 77 Aspartic acid (¹³C4, 99%; ¹⁵N, 99%); L-Cystine (¹³C6, 99%; ¹⁵N2, 99%); L-Glutamic acid (¹³C5,
- 78 99%; ¹⁵N, 99%); L-Histidine:HCL:H2O (<5% D) (U-¹³C6, 97-99%; U-¹⁵N3, 97-99%); L-Isoleucine
- 79 (¹³C6, 99%; ¹⁵N, 99%); L-Leucine(¹³C6, 99%; ¹⁵N, 99%); L-Methionine (¹³C5, 99%; ¹⁵N, 99%); L-
- 80 Phenylalanine (¹³C9, 99%; ¹⁵N, 99%); L-Proline (¹³C5, 99%; ¹⁵N, 99%); L-Threonine (¹³C4, 97-

- 81 99%; ¹⁵N, 97-99%); L-Tyrosine (¹³C9, 99%; 15N, 99%); and L-Valine (¹³C5, 99%; ¹⁵N, 99%)
- 82 (Cambridge Isotope) was diluted to 33 μM in 1% ascorbic acid MilliQ[®] H₂O (Millipore). Stock
- 83 solutions of labelled 1-C compounds were prepared from their corresponding powders of:
- 84 Homocysteine d4 (Novachem (CIL)); Cystathionine d4 (Novachem (CIL)); S-
- 85 Adenosylhomocysteine d4 (Sapphire bioscience (Cayman)); 5-Methyltetrahydrofolate d3
- 86 (Sapphire Bioscience Pty Ltd); Betaine d3 (SciVac PTY. Ltd. (CDN)), Dimethylglycine d3
- 87 (SciVac PTY. Ltd. (CDN)); and Taurine d4 (SciVac PTY. Ltd. (CDN)) diluted in 0.1 M HCl for all
- standards, except for 5-MTHF d3, which was diluted in 10 mM ammonium acetate (NH₄OAc)
- 89 with 10% ascorbic acid and 2% TCEP, at concentrations ranging from 0.5 to 5 mM. These
- 90 stock solutions were then diluted to 33 μ M in 1% ascorbic acid MilliQ[®] H₂O. A 1:1 mixture of
- 91 labelled AAs and 1-C compounds was used as the internal standard solution.
- 92 Dilution series' of unlabelled amino acids (Kit No. LAA-21, SIGMA[®] Chemical company, USA)
- 93 and 1-C metabolites were prepared at concentrations ranging from 1µM to 1000µM
- 94 (Supplementary tables 2 and 3), and mixed in a 1:1 ratio to create standard 8 (S8; Table 1).
- 95 The unlabelled standards consisted of Lysine, Taurine , OH-Proline, Proline, Aspartic acid,
- 96 Glutamine, Glycine, Serine, Asparagine, Glutamic acid, Dimethylglycine, Citrulline, Proline,
- 97 Betaine, Threonine, Cysteine, Ethanolamine, Alanine, Aminoadipic acid, Homocysteine,
- 98 Ornithine, Valine, Carnitine, Tyrosine, Choline, Methionine, Betaine, Cystathionine,
- 99 Phenylalanine, Isoleucine, Leucine, Histidine, Arginine, S-Adenosylhomocysteine,
- 100 Tryptophan, S-Adenosylmethionine, 1-Methylhistidine, 3-Methylhistidine, and 5-
- 101 Methyltetrahydrofolate (all purchased from Sigma Aldrich). Dilutions of unlabelled mixes
- 102 were prepared to create a wide dynamic range of concentrations that mirrors known
- 103 physiological plasma concentrations (Table 1).
- 104 Stripped human plasma (SeraCare Life Sciences Inc.) was used as a quality control (QC)
- 105 matrix to calculate compound recoveries. Triplicate QCs of stripped plasma at baseline and
- 106 $\,$ stripped plasma spiked with 70 μL of calibration standards (S7 and S8) were used for quality
- 107 control checking.

	Table 1	: Calibr	ation cu	urve coi	ncentra	tions			
Compound	S1	S2	S3	S4	S5	S6	S7	S8	Unit
Homocysteine	0.2	1	2	5	10	20	40	100	μM
Choline									μM
Dimethy glycine									μM
Glutamic acid	_								μM
Ornithine		0.4 2 4 10 20 40 8		200	μM				
Methionine	0.4		4	10	20	40	80	200	μM
Tyrosine									μM
Isoleucine									μM
Phenylalanine									μM

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Tryptophan									μM																
Ethanolamine									μM																
Amino adipic acid									μM																
Aspartic acid									μM																
Citrulline									μM																
1-methylhistidine									μM																
3-methylhistidine									μM																
OH-Proline									μM																
Histidine									μM																
Asparagine									μM																
Cysteine									μM																
Betaine	0.5	2.5	5	12.5	25	50	100	250	μM																
Leucine	0.6	3	6	15	30	60	120	300	μM																
Cystathionine									nM																
S-Adenosylhomocysteine (SAH)							-													nM					
S Adenosy -L–methionine (SAM)																				nM					
Taurine														1											μΜ
Alanine																					μM				
Serine									μM																
Glycine	1	5	10	25	50	100	200	500	μM																
Glutamine	-		10	20		100	200	500	μM																
Proline									μM																
Lysine									μM																
Arginine									μM																
Valine									μM																
Threonine									μM																
Carnitine									μM																
5-Methyltetrahydrofolic acid (5-MTHF)	5	25	50	125	250	500	1000	2500	nM																

108

109 Automated solid-phase extraction (SPE)

110 An Eppendorf robot fitted with both a thermal mixer and vacuum manifold (EpMotion

111 5075vt, Germany) was programmed using the epBlue Client v. 40.6.2.6 software to

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- 112 automate compound extractions from plasma samples (Figure 1). The protocol was
- 113 developed to extract one 96-well plate of samples including standards, blanks and QCs.
- 114 Internal standards, quality controls, calibration standards, the protein precipitation solution,
- 115 the TCEP solution, 1% ascorbic acid MilliQ[®] H_2O , and plasma samples were all placed in the
- 116 robot.

117 Protein precipitation

- 118 Firstly, 300 μL of 1% (v/v) formic acid in LC-Grade MeOH (in P3) is transferred into the all
- 119 wells (in P4) of the 96-well IMPACT[®] protein precipitation plate (Phenomenex[®]) fitted onto
- 120 a square 96-well (2ml) collection plate (Phenomenex[®]). A volume of 100 μ L of 1% ascorbic
- 121 acid in MilliQ[®] H₂O is dispensed into the first two wells as blanks with and without internal
- 122 standards. The internal standard solution (20 μ L from P3) is dispensed into the remaining
- 123 wells of the plate. Standards (100 $\mu\text{L}\textsc{;}$ in P2) and plasma samples (100 $\mu\text{L}\textsc{;}$ in P1) are
- transferred into the corresponding wells of the plate. Quality controls (QCs; 100 μL in
- 125 triplicate) are dispensed from P2 into three different locations across the plate, to enable
- 126 quantification of QC fluctuations at different injection times across the 96-well plate.
- 127

128 Mixing and vacuum extraction

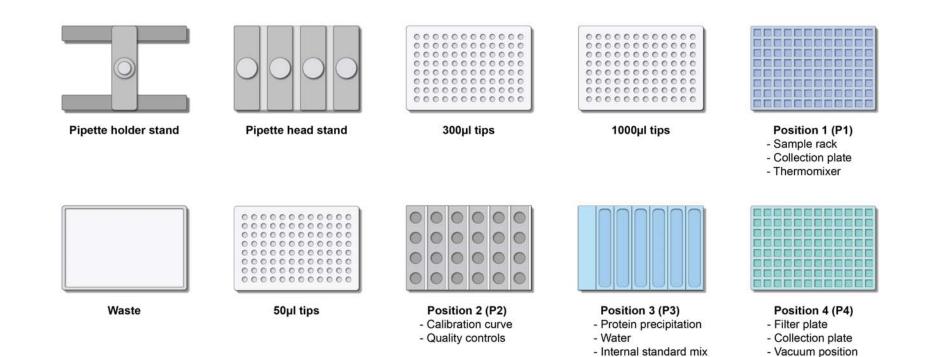
- 129 Once sample transfer is completed, the rack containing plasma samples in P1 is removed
- 130 from the robot, recapped, and stored (-80°C). The protein precipitation filtration plate and
- 131 catch plate are then placed on a thermomixer and agitated (5 min, 800rpm, room
- temperature). Once mixed, the plate is placed on the vacuum stand. A vacuum (450mbar,
- 133 10 min) is applied and the extracted compounds are collected in the catch plate.
- 134

135 Addition of the reducing agent TCEP

- 136 After precipitation of the extracted compounds, the filter plate is discarded and 100 μL of
- 137 Tris (2-carboxyethyl) phosphine (TCEP) is transferred from P3 to all wells of the collection
- 138 plate. TCEP reduces the disulphide bonds within cystine and homocystine, so they can be
- 139 quantified as cysteine and homocysteine.
- 140

141 Mixing and final dilution

- 142 The collection plate is placed on P1 for mixing (15 min, 800 rpm, room temperature), to
- 143 provide sufficient contact time between the TCEP solution and the extracted compounds of
- 144 interest for optimal compound reduction. A volume (200 μL) of 1% ascorbic acid in MilliQ[®]
- 145 H_2O is then added to each well. The plate is capped using a 96 square sealing mat
- 146 (Phenomenex®), mixed (5 min, 800rpm, room temperature), and placed in the UHPLC
- 147 system auto-sampler (10°C) for analysis.



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149 UHPLC/MS-MS working conditions

- 150 Ultra-high-pressure liquid chromatography coupled with tandem mass spectrometry was
- 151 performed using a Vanquish UHPLC system, coupled with a TSQ Quantiva triple quadrupole
- 152 mass spectrometer (Thermo Scientific), using a heated electrospray ionisation source (H-ESI)
- 153 in positive ionization mode. A Kinetex[®] EVO C18 100 Å 150x2.1mm 1.7μm column
- 154 (Phenomenex[®]) at 40°C, coupled with a Krudkatcher (Phenomenex[®]) pre-column filter, was
- used for chromatography. A flow of 400 μL/min starting at 2% Acetonitrile and 98% mobile
- phase consisting of 5mM perfluorohexanoic acid (PFHA) in MilliQ[®] H₂O was applied to the
- 157 column, compounds of interest were eluted using an increasing acetonitrile gradient (Table
- 158 2). The sample injection volume was 7 μ L, and the run time was 15.5 minutes.

	Table 2: LC flow gradient					
Time	Flow (ml/min)	Percentage Acetonitrile (%)				
0	0.4	2				
0.5	0.4	2				
2.5	0.4	15				
4.0	0.4	15				
6.3	0.4	20				
7.3	0.4	20				
9.5	0.4	95				
11.5	0.4	95				
11.6	0.4	2				
15.5	0.4	2				

159

160 Data processing

161 Data processing was carried out using Xcalibur version 4.0.27.19 (Thermo). Compounds

162 were assigned specific retention times (based on the injection of pure compounds), and

163 labelled standards for quantitation purposes. Unlabelled compounds that did not have

164 labelled counterparts were assigned other labelled compounds with similar properties (*e.g.*

165 SAM and SAH were both assigned SAH d4 as an internal standard for quantification). The

range of expected concentrations of the compounds in standards S1-S8 (Table 1) were alsoincluded.

168 Plasma sample validation

169 The process was validated using stripped plasma and pooled plasma samples from pregnant

170 women taking part in the Fish Oil in Pregnancy study. The validation included: 1) measures

171 of specificity and selectivity based on retention times; chromatographic separations and

172 spectral detection; 2) measures of matrix effects and standard recoveries by comparing

173 pure stripped plasma versus spiked stripped plasma samples; and 3) measures of

174 reproducibility by calculating coefficients of variation for multiple injections of the

independent extractions of the same pooled plasma sample within and across multiple

176 assay runs.

177

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178

179 Method development

180 Spectral Tuning

- 181 Compounds were tuned on a TSQ Quantiva mass spectrometer using the TSQ Quantiva Tune
 182 Application v. 2.0.1292.15 software. Compound tuning identifies the lens' radio frequencies
 183 (RF) and respective collision energies required to focus and fragment a parent ion into its
- 184 daughter ion(s). Each unlabelled standard was diluted from the stock solution in 1% ascorbic
- acid of MilliQ[®] H₂O. The tuning solution of each individual compound was loaded into a
- 186 tuning syringe. A LC flow (100-200 μ l/min) was introduced into the mass spectrometer via
- 187 'T' connector to mimic standard working conditions. After each standard was infused into
- 188 the mass spectrometer via a syringe, a stepwise entry of ascending collision energies was
- applied to identify the ideal conditions for the detection of the most abundant daughter ion
- of the corresponding parent ion of interest. The mass of the most abundant daughter ion
- 191 was identified along with its RF lens voltage and collision energy for each compound.

192 UHPLC/MS-MS Instrument setup

- 193 The instrument setup consisted of two stages: 1) chromatographic parameters; and 2)
- 194 spectral conditions. Chromatographic flow gradient parameters were optimised to maximise
- 195 compound separation whilst minimising assay run time. The optimised flow gradient is
- 196 detailed in Table 2. Spectral parameters were optimised through an instrument setup that
- 197 was drafted and edited throughout the method development process, including all
- 198 compound names, their corresponding collision energies, RF lens, parent and daughter mass
- 199 transitions, as well as expected retention times and windows.

200 Chromatographic separations

201 Chromatographic columns

- 202 Solutions of each compound and internal standard were tested to determine their retention
- times under the gradient used. Initial work used a Kinetex[®] 2.6μm F5 100 Å 150x2.1 mm
- 204 column (Phenomenex[®]) column to test chromatographic separations. However, some
- 205 compound peaks showed poor resolution. A smaller particle size column, the Kinetex®
- 206 $1.7\mu m$ EVO C18 100 Å 150 x2.1 mm column (Phenomenex[®]) showed improved resolution,
- and was used for chromatographic separations instead.

208 *Ion-pairing reagents*

- 209 Ion-pairing reagents are mobile phase additives pairing with highly ionic compounds to
- 210 improve their adsorption to the stationary phase of the chromatographic column.
- 211 Heptafluorobutyric acid (HFBA) was initially tested as an ion-pairing reagent, but exhibited
- 212 poor retention of some compounds in this method. Perfluorohexanoic acid (PFHA)
- $213 \qquad \text{improved compound retention on the chromatographic column (5mM of PFHA in MilliQ^{\circledast})}$
- $\label{eq:H2O} 214 \qquad {\sf H_2O} \text{) and was subsequently used instead.}$
- 215
- 216

217

218 Results and discussion

219 Parent-product ion transitions, collision energies, and RF lens of all compounds were 220 obtained (Table 3). The compounds included in this panel are present in a wide range of 221 metabolic networks and have been associated with health and disease outcomes (i.e. the 1-222 carbon metabolism, the urea cycle, ketogenic and glucogenic amino acids involved in the 223 tricarboxylic acid (TCA) cycle, branched-chain amino acid (BCAA) metabolism, Trimethylamine N-Oxide (TMAO) metabolism, and gamma-aminobutyric acid (GABA) 224 225 metabolism (14–21)). It has been argued that quantifying single blood biomarkers that are 226 robustly associated with an outcome of interest (e.q. hsCRP, HbA1c) may be more clinically 227 relevant for bigger picture recommendations and the development of public health policies 228 (22). Whilst robust biomarkers must be profiled for diagnostic purposes, linking nutritional 229 metabolites (e.g. 1-C metabolites, and amino acid profiles), to pre-established markers of 230 health outcomes remains crucial for the characterisation of - potentially targetable -231 underlying mechanistic layers linking exposure to outcome (19,23). Of these mechanisms, 232 epigenetic processes (such as DNA and histone methylation) are largely dependent on the 233 availability of methyl (-CH₃) groups released by methyl donors produced from the one-234 carbon metabolism (24–28). Briefly, this analytical panel measures metabolites that are at 235 the intersection of lifestyle, nutrition, metabolism, and epigenetics (24–28). Whilst some of 236 these compounds are unstable, prone to oxidation, and tend to degrade in samples stored 237 for long periods, the exhaustiveness of our panel allows for a biologically relevant, yet still 238 practically applicable coverage of multiple biological networks in a single 100µl plasma 239 sample.

240)
210	,

Compound	Retention Time (min)	Precursor (m/z)	Product	Collision Energy (V)	RF Lens (V)
Taurine	0.7	126.0	108.1	14	63
Taurine d4	0.7	130.1	112.1	14	63
Aspartic acid	1.4	134.0	74.0	20	63
Aspartic acid ¹³ C4 ¹⁵ N	1.4	139.0	74.2	15	63
OH-Proline	1.5	132.1	86.1	20	63
Asparagine	1.6	133.0	74.0	20	63
Serine	1.6	106.0	60.0	10	30
Glutamine	1.9	147.1	84.1	20	63
Glycine	1.9	76.2	30.2	10	30
Glutamic acid	2.0	148.1	84.0	20	63
Glutamic acid ¹³ C5 ¹⁵ N	2.0	154.1	89.1	15	63
Cysteine	2.0	122.0	59.1	17	63
Threonine	2.1	120.1	74.1	15	63
Threonine ¹³ C4 ¹⁵ N	2.1	125.1	78.2	10	63

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DMG	2.3	104.1	58.1	20	63
DMG d3	2.3	107.1	61.1	20	63
Betaine	2.6	118.2	58.15	28	63
Betaine d3	2.6	121.1	61.1	28	63
Alanine	2.8	90.1	44.1	10	34
Aminoadipic acid	2.9	162.1	98.1	14	35
Citrulline	3.3	176.1	159.0	10	32
Proline	3.5	116.1	70.1	20	63
Proline ¹³ C5 ¹⁵ N	3.6	122.1	75.2	16	63
Homocysteine	3.9	136.0	90.1	13	63
Homocysteine d4	3.9	140.0	94.1	13	63
Ethanolamine	4.0	62.3	44.1	10	30
Carnitine	5.0	162.1	103.0	30	63
Tyrosine	5.3	182.1	136.1	20	63
Tyrosine ¹³ C9 ¹⁵ N	5.3	192.1	145.2	13	63
, Choline	5.5	104.2	60.2	20	63
Methionine	5.7	150.1	104.1	10	63
Methionine ¹³ C5 ¹⁵ N	5.7	156.1	109.1	10	63
Valine	5.8	118.1	72.1	20	63
Valine ¹³ C5 ¹⁵ N	5.8	124.1	77.2	10	63
5-					
Methyltetrahydrofolate	8.8	460.1	313.1	19	63
(5-MTHF)					
5- Methyltetrahydrofolate	8.8	463.2	316.1	19.3	92
d3 (5-MTHF d3)	0.0	403.2	510.1	19.5	92
Isoleucine	8.2	132.1	86.1	20	63
Isoleucine ¹³ C6 ¹⁵ N	8.2	139.1	92.2	11	63
Leucine	8.7	132.1	86.1	20	63
Leucine ¹³ C6 ¹⁵ N	8.7	139.1	92.2	11	63
Phenylalanine	8.8	166.1	120.1	20	63
Phenylalanine ¹³ C9 ¹⁵ N	8.8	176.1	129.1	14	63
Cystathionine	8.9	223.0	134.1	14	58
Cystathionine d4	8.9	227.1	138.0	14	49
Tryptophan	9.1	205.1	159.1	20	63
1-Methyl histidine	9.1	170.1	124.1	20	63
3-Methyl histidine	8.9	170.1	96.1	20	63
Histidine	9.1	156.1	110.1	10	63
Histidine ¹³ C6 ¹⁵ N3	9.1	165.1	87.2	30	63
Ornithine	9.1	133.1	70.1	15	63
Lysine	9.2	147.0	128.8	10	60
S-Adenosyl- homocysteine (SAH)	9.2	385.0	134.0	20	63
nomocysteme (SAA)					

S-Adenosyl- homocysteine d4	9.2	389.0	136.0	18	63
Arginine	9.2	175.1	70.1	20	63
Arginine ¹³ C6 ¹⁵ N4	9.2	185.1	75.2	23	63
S-Adenosylmethionine (SAM)	9.4	399.0	250.1	11	63

241

242 Compound recoveries and inter-assay coefficients of variations

243 A number of plates were tested during method development. Quality control (QC) results of 244 96-well plates profiled by the same user between March and July 2019 were reported in the 245 following, QCs consisted of: QC-1 (stripped plasma at baseline), QC-2 (stripped plasma 246 spiked with S7 concentration), QC-3 (stripped plasma spiked with S8 concentration), and 247 QC-4 (real pooled plasma samples). Triplicate QCs were injected at three different locations 248 of a 96-well plate to track compound performance and stability across a plate taking 26-30h 249 to run. The injection time separating each set of QCs was approximately 10 hours allowing for a good representation of real changes occurring in samples throughout the plate. 250 251 Compound recoveries reported were calculated by comparing baseline stripped plasma with 252 spiked stripped plasma (Table 4). Given that each compound behaves slightly differently 253 across plates profiled months apart, outliers were excluded from the total recovery 254 calculations (1, 2, and 3). The exclusion criteria were \pm 2sds for most compounds, and \pm 1sd 255 for those that tended to fluctuate more markedly over 5 months of runs (Asparagine. 256 Cysteine, Betaine, Ethanolamine, and S-Adenosylhomocysteine). The reported recoveries 257 were mostly for the S7 spike, given that it is closer to physiological ranges of compound 258 concentrations in plasma, and is therefore more biologically relevant. For metabolites 259 exhibiting lower sensitivity or higher baseline levels in stripped plasma, a higher spike 260 concentration S8 was used for this calculation. These compounds were Cysteine, Betaine, 261 Alanine, S-Adenosylhomocysteine, Asparagine, and Glutamic Acid. All compounds recovered 262 within two standard deviations of 100% recovery, highlighting a reliable quantitation of 263 compounds of interest (Table 4). 5-Methyltetrahydrofolate (5-MTHF) had an acceptable 264 recovery but results for this compound were inconsistent across runs. This is a clear 265 downfall of a complex panel attempting to quantify multiple compounds simultaneously. 266 Regardless of the acceptable recoveries in some plates, the inconsistencies between plates 267 highlight the need to quantify folate derivatives such as 5-MTHF in a specialized method 268 with minimal extraction time and stringent, light-protected blood collection methods given 269 the highly unstable and oxidative nature of these compounds (29,30).

270 Mean concentration calculations across assays

- 271 Compound concentrations were reported as average concentrations of pooled plasma QCs
- within the ±2 sds of the average across plates profiled between March and July 2019.
- 273 Compounds reported as below LOQ (limit of quantification) were those exhibiting
- 274 concentrations below the lowest calibration curve standard (S1).

275 Reproducibility, inter- and intra-assay coefficients of variation

- 276 Compound reproducibilities were calculated by comparing compound concentrations 1) at
- 277 different locations on the same 96-well plate to monitor fluctuations across a run (every

- 278 10h); and 2) between plates by calculating standard deviations of pooled plasma QCs (QC4)
- injected in different plates, across several months. Inter- and intra-assay variabilities were
- reported (Table 4), most of which were below our 20% cut-off, pinpointing a stable and
- 281 consistent quantitation of these metabolites for the same samples both within and between
- assays. For compounds exhibiting low concentrations in pooled plasma, inter- and intra-
- assay reproducibility was reported for spiked stripped plasma samples exhibiting higher
- 284 concentrations. These include: Aspartic acid, OH-Proline, Aminoadipic Acid, and 3-
- 285 Methylhistidine. The rationale behind that substitution is that very low concentrations are
- bound to give falsely higher coefficients of variations, therefore falsely lower reproducibility.

Compound	Recoveries in stripped plasma (Rounded %)	Mean levels in pooled fasted plasma	Unit	Coefficient of variation of pooled plasma concentration within a plate or intra-assay variability (Rounded %)	Coefficient of variation of pooled plasma concentration across plates or inter-assay variability (Rounded %)
Lysine	105	178	μM	11	19
Taurine	111	33	μM	14	25
OH-Proline	91	8	μM	6	12
Aspartic acid	96	4	μM	7	13
Glutamine	102	678	μM	6	22
Serine	90	79	μM	9	8
Glycine	102	144	μM	10	13
Asparagine	87	31	μM	5	8
Glutamic acid	91	40	μM	4	7
DMG	92	2	μM	5	20
Citrulline	90	15	μM	10	20
Proline	91	141	μM	4	6
Betaine	79	13	μM	7	13
Threonine	84	138	μM	5	9
Cysteine	77	47	μM	10	17
Alanine	91	260	μM	7	10
Homocysteine	77	1	μM	14	20
Ornithine	83	14	μM	22	13
Valine	92	157	μM	4	8
Carnitine	109	25	μM	11	22
Tyrosine	89	36	μM	4	5

Choline	116	9	μM	10	15
Methionine	95	19	μM	4	7
Cystathionine	97	99	nM	14	18
Phenylalanine	92	48	μM	3	2
Isoleucine	91	43	μM	4	6
Leucine	90	80	μM	4	8
Histidine	100	76	μM	7	9
Arginine	96	60	μM	5	7
S-Adenosylhomocysteine (SAH)	79	31	nM	21	15
S-Adenosylmethionine (SAM)	99	61	nM	14	18
Tryptophan	95	44	μM	12	22
1-Methyl Histidine	81	3	μM	6	19
3-Methyl Histidine	88	5	μM	8	9
Aminoadipic acid	81	3	μM	9	10
Ethanolamine	128	<loq*< td=""><td>μM</td><td>N/A</td><td>N/A</td></loq*<>	μM	N/A	N/A
5-Methyltetrahydrofolate (5- MTHF)	91	27	nM	N/A	N/A

289 Conclusion

- 290 We have developed, robotically automated, and validated a methodology for the
- simultaneous quantitation of an extensive metabolic panel of 1-C compounds, amino acids
- and precursors, as well as plasmalogens in human plasma. Our method has two key
- advantages over existing methods: Firstly, our technique is highly reproducible and robust
- 294 due to the robotic automation of sample preparation and compound extraction. The ability
- to measure metabolites such as these directly from their sample vial with no manual
- 296 'intervention' is attractive from an analysis and laboratory staffing point of view. Secondly,
- 297 our method has a greater coverage of compounds from a number of metabolic pathways,
- when compared to previous methods (4,5), which provides simultaneous information on
- 299 interconnected biological processes rather than focusing on just one. These advantages
- 300 mean that this method has the potential for wide-spread application to large cohorts in a
- 301 wide range of fields (7,31–33).

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407 **Conflicts of interest**

- 408 The authors declare no competing financial interest
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