

#### Video Article

## A Strategy for Sensitive, Large Scale Quantitative Metabolomics

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## **Abstract**

Metabolite profiling has been a valuable asset in the study of metabolism in health and disease. However, current platforms have different limiting factors, such as labor intensive sample preparations, low detection limits, slow scan speeds, intensive method optimization for each metabolite, and the inability to measure both positively and negatively charged ions in single experiments. Therefore, a novel metabolomics protocol could advance metabolomics studies. Amide-based hydrophilic chromatography enables polar metabolite analysis without any chemical derivatization. High resolution MS using the Q-Exactive (QE-MS) has improved ion optics, increased scan speeds (256 msec at resolution 70,000), and has the capability of carrying out positive/negative switching. Using a cold methanol extraction strategy, and coupling an amide column with QE-MS enables robust detection of 168 targeted polar metabolites and thousands of additional features simultaneously. Data processing is carried out with commercially available software in a highly efficient way, and unknown features extracted from the mass spectra can be queried in databases.

#### Video Link

The video component of this article can be found at https://www.jove.com/video/51358/

## Introduction

Metabolomics, defined as an experiment that measures multiple metabolites simultaneously, has been an area of intense interest. Metabolomics provides a direct readout of molecular physiology and has provided insights into development and disease such as cancer<sup>1-4</sup>. Nuclear magnetic resonance (NMR) and gas chromatography-mass spectrometry (GC-MS) are among the most commonly used instruments<sup>5-9</sup>. NMR, especially has been used for flux experiments since heavy isotope labeled compounds, such as <sup>13</sup>C labeled metabolites, are NMR-active <sup>10,11</sup>. However, this strategy requires relatively high sample purity and large sample quantity, which limits its applications in metabolomics. Meanwhile, data collected from NMR needs intensive analysis and compound assignment of complex NMR spectra is difficult. GC-MS has been widely used for polar metabolites and lipid studies, but it requires volatile compounds and therefore often derivatization of metabolites, which sometimes involves complex chemistry that can be time consuming and introduces experimental noise.

Liquid chromatography (LC) coupled to triple quadrupole mass spectrometry uses the first quadrupole for selecting the intact parent ions, which are then fragmented in the second quadrupole, while the third quadrupole is used to select characteristic fragments or daughter ions. This method, which records the transition from parent ions to specific daughter ions, is termed multiple reaction monitoring (MRM). MRM is a very sensitive, specific, and robust method for both small molecule and protein quantitation<sup>12-15,21</sup>. However, MRM does have its limitations. To achieve high specificity a MRM method needs to be built for each metabolite. This method consists of identifying a specific fragment and corresponding optimized collision energy, which requires pre-knowledge of the properties of the metabolites of interest, such as chemical structure information. Therefore, with some exceptions involving the neutral loss of common fragments, it is not possible to identify unknown metabolites with this method.

In the recent years, high-resolution mass spectrometry (HRMS) instruments have been released, such as the LTQ-orbitrap and Exactive series, the QuanTof, and TripleTOF 5600<sup>16-18,22</sup>. HRMS can provide a mass to charge ratio (m/z) of intact ions within an error of a few ppm. Therefore, an HRMS instrument operated by detecting all precursor ions (*i.e.* full scan mode) can obtain direct structural information from the exact mass and the resulting elemental composition of the analyte, and this information can be used to identify potential metabolites. Indeed, all information about a compound can be obtained with an exact mass, up to the level of structural isomers. Also, a full scan method does not require previous knowledge of metabolites and does not require method optimization. Moreover, since all ions with m/z falling into the scan range can be analyzed, HRMS has a nearly unlimited capacity in terms of the number of metabolites that can be quantified in a single run compared to the MRM method. HRMS is also comparable to a triple quadrupole MRM in quantitative capacity due to the short duty cycle resulting in a comparable number of data points that can be obtained in a full MS scan. Therefore, HRMS provides an alternative approach for quantitative metabolomics. Recently, an improved version of HRMS termed Q-Exactive mass spectrometry (QE-MS) can be operated under the



switching between positive and negative modes with sufficiently fast cycle times in a single method, which expands the detection range<sup>19</sup>. Here we describe our metabolomics strategy using the QE-MS.

#### **Protocol**

# 1. Preparation of LC-MS Reagents, Establishment of a Chromatography Method, and Establishment of Instrument Operating Procedures

- 1. Preparation of LC Solvents
  - 1. Prepare 500 ml mobile phases. A is 20 mM ammonium acetate and 15 mM ammonium hydroxide in 3% acetonitrile/water, final pH 9.0; and B is 100% acetonitrile.
  - 2. Loosely cap the bottle, place it in a water bath sonicator, and sonicate for 10 min without extra heating. (This step is to ensure that all of the ammonium salts completely dissolve and that there are no residual air bubbles.)
  - 3. Transfer 250 ml of the solvent to a 250 ml glass bottle for LC-MS use, and keep the remainder at 4 °C.
- 2. Prepare the low mass range calibration solution. It is important to use a customized low mass range calibration mixture for metabolomics applications to ensure that accurate masses are detected at low molecular weights.
  - 1. Weigh 5 mg of both sodium fluoroacetate and homovanillic acid and dissolve them into 5 ml water to make a final concentration of 1 mg/ml. Dissolve diazinon in methanol to make a final concentration of 10 mg/ml.
  - 2. To prepare 1 ml of negative low mass calibration solution, mix 960 ml of thermo negative calibration solution with 20 ml of sodium fluoroaceate and homovanillic acid solution. To make 1 ml of positive low mass calibration solution, mix 990 ml of thermo positive calibration solution and 10 ml diazinon solution. (The low mass calibration solution should be stored at 4 °C and be prepared fresh every 2 months.)
- 3. Calibration of QE-MS at a Low Mass Range
  - 1. Before performing low mass range calibration, carry out a standard mass calibration (m/z, 150-2,000) in both positive and negative modes based on the manufacturer's instructions.
  - 2. Once a regular mass calibration passes, adjust the scan range to 60-900 m/z in the instrument control panel and a source CID of 25 eV for positive mode and 35 eV for negative mode is applied. (This will give robust signals of the caffeine fragment ion and the sulfate ion. The scan range here is fixed, because the last m/z shouldn't be larger than 15x of the starting m/z)
  - 3. Once the ion source is stable, then perform the customized calibration. Note: A stable source is defined as less than 10% of the total ion current variation in positive mode, and less than 15% in negative mode. The customized calibration ions and corresponding m/z are listed in **Table 1.**
- 4. Establish the LC-MS instrumentation for polar metabolite analysis. LC is coupled to a QE-MS for metabolite separation and detection.
  - Equip the QE-MS with a Heated electrospray ionization probe (H-ESI). Set the relevant tuning parameters for the probe as listed: heater temperature, 120 °C; sheath gas, 30; auxiliary gas, 10; sweep gas, 3; spray voltage, 3.6 kV for positive mode and 2.5 kV for negative mode. Set the capillary temperature at 320 °C, and S-lens at 55.
  - Build a full scan method as follows: Full scan range: 60 to 900 (m/z); resolution: 70,000; maximum injection time: 200 msec with typical injection times around 50 msec; automatic gain control (AGC): 3,000,000 ions. These settings result in a duty cycle of around 550 msec to carry out scans in both positive and negative mode.
  - 3. Establish the chromatography method. Employ an amide column (100 x 2.1 mm i.d., 3.5 mm) for compound separation at room temperature <sup>13,15</sup>. The mobile phase A is as described above, and mobile phase B is acetonitrile. Use a linear gradient as follows: 0 min, 85% B; 1.5 min, 85% B, 5.5 min, 35% B; 10min, 35% B, 10.5 min, 35% B, 14.5 min, 35% B, 15 min, 85% B, and 20 min, 85% B. The flow rate is 0.15 ml/min from 0 to 10 min and 15 to 20 min, and 0.3 ml/min from 10.5 to 14.5 min.

## 2. Preparation of Metabolite Samples

- 1. Prepare an extraction solvent. Mix 40 ml methanol (LC-MS grade) and 10 ml water (LC-MS grade) in a 50 ml tube, and keep it in -80 °C freezer for at least 1 hr before use. Note: This procedure and the steps below can be modified for the extraction of biological tissue and fluid samples.
  - Culture colon cancer HCT 8 cells in three 10 cm dishes or 6-well plates with full growth medium, RPMI 1640 supplemented with 10% heat inactivated Fetal Bovine Serum and 100,000 units/L penicillin and 100 mg/L streptomycin.
  - 2. When cells reach 80% confluence, quickly remove the medium, and place the dish or plate on top of dry ice <sup>13,15</sup>. Add 1 ml extraction solvent immediately (80% methanol/water), and transfer the plate to the -80 °C freezer. For a 10 cm dish, add 3 ml of extraction solvent to each well. (Try to remove the medium as much as possible to avoid the ion suppression effect due to residual salts from medium.)
  - 3. Leave the plate for 15 min. Remove it from the freezer, and scrape cells into the solvent on dry ice. Transfer the solution to 1.7 ml Eppendorf tubes, and centrifuge with the speed of 20,000 x g at 4 °C for 10 min. (Prepare cell metabolites from three separate dishes to make three replicate samples. The purpose of keeping two tubes is to have one as a backup.)
  - 4. Transfer the supernatant to two new Eppendorf tubes, and dry them in a speed vacuum. This takes about 3-6 hr depending on the speed vacuum used. (The samples can also be dried overnight under nitrogen gas.)
  - 5. After drying, store tubes of each sample in the -80 °C freezer. When ready, reconstitute one sample into 20 ml water (LC-MS grade), and inject 5 ml to LC-QE-MS for analysis.



## 3. Setup of Sample Sequence

- Once the calibration has been properly carried out on the QE-MS, equilibrate LC column for 5 min with 85% A at a flow rate of 0.15 ml/min, which is the starting condition of the LC gradient.
- 2. Set up the sample sequence in random order. Note: In this way, it distributes the fluctuations introduced by the LC-MS to each sample and ensures more accurate comparison between different samples. Every 6 samples, add a wash run, which shares the same MS method, except the LC gradient is 95% A for 10 min and followed by a 5 min column equilibration at 85% A with a flow rate of 0.15 ml/min. Add blank samples (100% water) after each wash run to assess the system background and carry over levels.
- 3. Save the sequence and once the LC column shows stable pressure, around 400 psi, start the sequence run. If there is no other sample is to be run after this sequence, then add a stop run in the end of the sequence, which has a flow rate of 0 ml/min in the end of the gradient and choose "standby" after finishing the sequence.
- 4. Re-run the same sample set 12 hr after calibration. (This is to assess the mass error fluctuation after calibration.)

## 4. Post Analysis Instrument Cleaning and Maintenance

- 1. At the end of sequence, wash the column with 95% A at a flow rate of 0.2 ml/min for 2 hr, and if necessary, reverse the column before washing.
- 2. Remove the LC column and directly connect the LC to the ion source by a union. Prepare cleaning solvent, water/methanol/formic acid (v:v:v, 90:10:0.2), set MS on standby mode, and wash LC-MS system at a flow rate of 0.1 ml/min for 1 hr to remove the residual precipitated salts or other impurities. Lower the flow rate if there is too much system pressure.
- 3. Set the capillary temperature at 50 °C, and remove the ion cage. Carefully take out the ion sweep cone and the ion transfer tube after the capillary temperature drops to 50 °C. Use a rough mesh, such as sandpaper, to remove impurities left on the surface of the ion sweep cone.
- 4. Place the ion transfer tube into a 15 ml Falcon tube containing 10 ml 90% water/methanol with 0.1% formic acid. After sonicating the tube in a water bath sonicator for 20 min, decant the solvent inside, replace it with 10 ml pure methanol and sonicate for another 20 min. (If necessary, the sonication can be done at 40 °C or an even higher temperature to achieve better cleaning results.)

## 5. Analysis of LC-MS Data

- 1. To ensure the sample sequence runs smoothly, after finishing the first two samples in the sequence, check peaks for unknown metabolites. Use a csv file listing metabolite names, neutral chemical formula and detection mode (either positive or negative), as the input file, and the output file contains extracted peaks and mass error in ppm. If the peak shape is abnormal or the mass error is off by more than 5 ppm, then the rest of the sequence needs to be stopped and troubleshooting needs to be done.
- Choose the method of "peak alignment and frame extraction" on commercially available software. Select raw data from LC-MS and group
  them. Pick samples in the middle of the run sequence as chromatography reference sample for peak alignment. Upload a frame seed
  including known metabolites for the targeted metabolites analysis with data collected and the corresponding frame seed.
- 3. Perform data analysis in positive and negative mode separately. Use the default setting for other parameters. Turn off the database search function and run the workflow. Export the processed data as an excel sheet containing peak area of every frame. The first sets of frames correspond to the metabolites in the targeted list. Note: For a targeted metabolite analysis, the metabolites information is obtained based on the previous studies<sup>13,15</sup>.
- 4. For an untargeted metabolite analysis, choose the method of "component extraction". Load blank samples for background subtraction. Set peak intensity threshold at 10<sup>5</sup>, m/z width of 10 ppm and signal to noise ratio of 3.
- 5. Use human metabolome database for unknown compounds identification. Use a CV filter to remove the components with large CVs within replicate samples. Manually go through each component and pick those with well-defined peak or relatively big difference in different samples types for database search. Export data with hits in database. (Peak alignment could be bypassed if the peak alignment score is too low.)

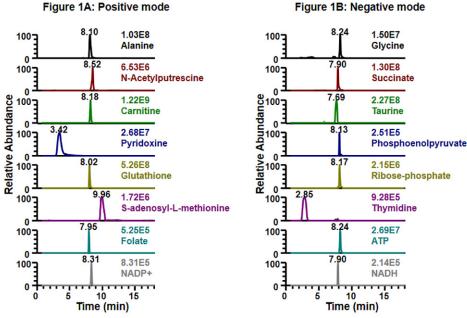
## Representative Results

The accuracy of metabolomics data highly depends on the LC-QE-MS instrument performance. To assess whether the instrument is operating in good condition, and whether the method applied is proper, several known metabolite LC peaks are extracted from the total ion chromatography (TIC), as shown in **Figure 1**. Polar metabolites, including amino acids, glycolysis intermediates, TCA intermediates, nucleotides, vitamins, ATP, NADP<sup>+</sup> and so on have good retention on the column and good peak shapes in the amide column under current LC conditions. Meanwhile, a mass error test is done within 24 hr after low mass calibration, as illustrated in **Figure 2**. 6 different concentrations of samples in triplicate are run twice after calibration, and the whole time range covers almost 24 hr. The mass error is assessed by comparing the detected m/z to the theoretical m/z of targeted metabolites. Here the targeted metabolites have an m/z ranging from 74 (glycine) to 744 (NADP<sup>+</sup>). The Y axis here represents the accumulative percentage of metabolites within certain mass error range. The blue curve shows the result from 0-12 hr, while the red colored curve shows the data collected from 12-24 hr. **Figure 2** clearly indicates that more than 90% of metabolites are within 5 ppm mass error, which means the low mass range calibration method developed here is sufficient to maintain 5 ppm mass error for low mass range detection.

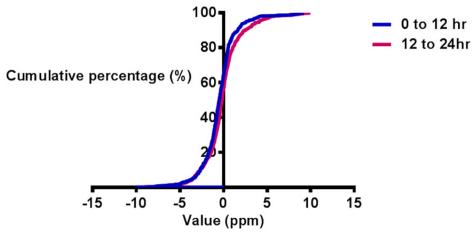
Another issue to be addressed is the sensitivity of the instrument with the current method and instrument setup. A serial dilution of triplicate samples from 10 cm Petri dish was done 5 times with a dilution factor of 6, ending up with 6 different concentrations of samples. These samples represent the amount of metabolites extracted from  $10^7$ ,  $1.67 \times 10^6$ ,  $2.78 \times 10^5$ ,  $4.63 \times 10^4$ ,  $7.72 \times 10^3$ , and  $1.29 \times 10^3$  of cells, respectively. Since each concentration of sample is prepared in triplicate, a total of 18 samples are analyzed in LC-QE-MS. A targeted list is used to assess the number of metabolites detected at for differing concentration of sample. The result in **Figure 3** indicates that the optimal number of targeted metabolites detected is between  $2.78 \times 10^5$  and  $1.67 \times 10^6$  cells, while  $1 \times 10^7$  cells give a fewer number of detected metabolites, which is due

to ion suppression effects. This result indicates that the optimal amount of cells to extract for this analysis is roughly that of a well of in a 6-well plate.

For untargeted metabolite analysis, a CV cutoff of 20% and an average intensity value of 10<sup>7</sup> are used to filter the components table. These rigid CV and average intensity threshold values are used for this demonstration aim. To improve reproducibility, CV cutoff values can be increased (for example, 30%) while the average intensity values need to be decreased (for example, 10<sup>5</sup>) to include more peaks. After manually checking peaks, components with good shapes are selected and searched for in the human metabolome database. The results are shown in **Table 2**. **Table 2A** lists the results from data collected in positive mode, while **Table 2B** shows the results from negative mode. Some of the metabolites identified here overlap with the metabolites in the targeted list, such as glutathione, proline and so on, but meanwhile, additional metabolites absent from the targeted list are explored, such as methyglyoxal, which can be derived from glycolysis, and 1-palmitoyl-2-oleoyl-*sn*-glycero-3-phosphocholine, which is detected in positive with a retention time of 3.2 min, which is a reasonable retention for phospholipids on an amide column. A protocol on untargeted metabolite database searching has been previously reported.



**Figure 1. Examples of LC-MS chromatography peaks.** Here, the reconstructed chromatography is generated with a mass window of 10 ppm (m/z ± 5 ppm). The X axis shows the retention time, while the Y axis shows the relative intensity, and the peak intensity is listed above every metabolite. **A** shows peaks detected from positive mode, while **B** shows peaks from negative mode. Click here to view larger image.



**Figure 2. Evaluation of low mass range calibration.** The Y axis is the cumulative percentage of metabolites with mass detection error within 5 ppm. The X axis is the mass error range in ppm. Blue and red curves represent 0-12 hr and 12-24 hr, respectively. Click here to view larger image.

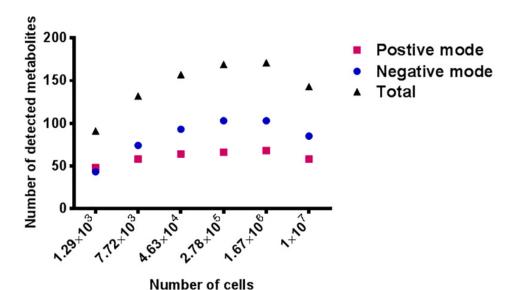


Figure 3. Evaluation of sample amount - number of targeted metabolites detected versus number of HCT 8 cells. Red squares represent metabolites detected in positive mode, blue circles mean metabolites measured in negative mode, and the black triangles are the total numbers of metabolites from both positive and negative mode. The X axis shows the number of HCT 8 cells. Click here to view larger image.

Standards	M/Z, positive mode	M/Z, negative mode	Neutral formula	Neutral mass
<i>n</i> -Butylamine	74.096425	NA	C <sub>4</sub> H <sub>11</sub> N	73.089149
Caffeine fragment	138.066188	NA	C <sub>6</sub> H <sub>8</sub> N <sub>3</sub> O	137.058912
Caffeine	195.087652	NA	C <sub>8</sub> H <sub>11</sub> N <sub>4</sub> O <sub>2</sub>	194.080376
Diazinon	305.108329	NA	C <sub>12</sub> H <sub>20</sub> N <sub>2</sub> O <sub>3</sub> PS	304.101053
MRFA peptide	524.264966	NA	C <sub>23</sub> H <sub>37</sub> N <sub>7</sub> O <sub>5</sub> S	523.25769
Fluoroacetate	N/A	77.004432	C <sub>2</sub> H <sub>3</sub> FO <sub>2</sub>	78.011708
Sulfate	N/A	96.960106	H <sub>2</sub> SO <sub>4</sub>	97.967382
Homovanillic acid	N/A	181.050634	C <sub>9</sub> H <sub>10</sub> O <sub>4</sub>	182.05791
Dodecyl sulfate	N/A	265.147906	C <sub>12</sub> H <sub>26</sub> SO <sub>4</sub>	266.155182
Taurocholate	N/A	514.2844	C <sub>26</sub> H <sub>45</sub> NO <sub>7</sub> S	515.291676

Table 1. Low mass range calibration standards and their exact m/z. The formula shown here is corresponding to the neutral form formula, and m/z is the neutral mass plus or minus a proton.

CSID	Name	Formula	Monoisotopic Mass	Search Mass	Error (ppm)	R.T. (min)
234	beta-Alanine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04800	89.04805	0.62	8.08
1057	Sarcosine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04768	89.04805	4.22	8.08
5735	alanine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04768	89.04805	4.22	8.08
568	Creatinine	C <sub>4</sub> H <sub>7</sub> N <sub>3</sub> O	113.05900	113.05889	1.00	4.41
128566	Proline	C <sub>5</sub> H <sub>9</sub> NO <sub>2</sub>	115.06333	115.06338	0.41	7.54
6050	L-(+)-Valine	C <sub>5</sub> H <sub>11</sub> NO <sub>2</sub>	117.07898	117.07896	0.18	7.42
7762	Amyl nitrite I	C <sub>5</sub> H <sub>11</sub> NO <sub>2</sub>	117.07898	117.07896	0.18	7.42
135	5-amino valeric acid	C <sub>5</sub> H <sub>11</sub> NO <sub>2</sub>	117.07900	117.07896	0.38	7.42
242	trimethylglycine	C <sub>5</sub> H <sub>11</sub> NO <sub>2</sub>	117.07900	117.07896	0.38	7.42
911	Niacinamide	C6H6N2O	122.04800	122.04793	0.55	2.60
1091	Taurin	C <sub>2</sub> H <sub>7</sub> NO <sub>3</sub> S	125.01466	125.01469	0.20	7.61

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1030	Pyrroline hydroxycarboxylic acid	C <sub>5</sub> H <sub>7</sub> NO <sub>3</sub>	129.04259	129.04259	0.02	8.51
7127	PCA	C <sub>5</sub> H <sub>7</sub> NO <sub>3</sub>	129.04259	129.04259	0.02	8.51
90657	N-Acryloylglycine	C <sub>5</sub> H <sub>7</sub> NO <sub>3</sub>	129.04259	129.04259	0.02	8.51
388752	5-Oxo-D-prolin	C <sub>5</sub> H <sub>7</sub> NO <sub>3</sub>	129.04259	129.04259	0.02	8.51
389257	3-Hydroxy-3,4- dihydro-2H- pyrrole-5- carboxylic acid	C <sub>5</sub> H <sub>7</sub> NO <sub>3</sub>	129.04259	129.04259	0.02	8.51
8031176	Pyrrolidonecarboxyli acid	C₅H <sub>7</sub> NO₃	129.04259	129.04259	0.03	8.51
5605	Hydroxyproline	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
7068	N-Acetylalanin	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
79449	Ac-Ala-OH	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
89122	Ethylformylglycine	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
167744	I-Glutamic-gamma- semialdehyde	C₅H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
388519	5-Amino-2- oxopentanoic acid	C₅H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05901	5.83	8.08
134	Aminolevulinic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05800	131.05901	7.70	8.08
9312313	3-Hydroxy-L- proline	C₅H <sub>9</sub> NO <sub>3</sub>	131.05800	131.05901	7.70	8.08
566	Creatine	C <sub>4</sub> H <sub>9</sub> N <sub>3</sub> O <sub>2</sub>	131.06900	131.06905	0.36	8.08
5880	L-(+)-Leucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09455	0.68	6.96
6067	L-(+)-Isoleucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09455	0.68	6.96
19964	L-Norleucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09455	0.68	6.96
388796	beta-Leucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09455	0.68	6.96
548	Aminocaproic acid	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09500	131.09455	3.48	6.96
6031	L-(-)-Asparagine	C <sub>4</sub> H <sub>8</sub> N <sub>2</sub> O <sub>3</sub>	132.05350	132.05348	0.10	8.31
109	Ureidopropionic acid	C <sub>4</sub> H <sub>8</sub> N <sub>2</sub> O <sub>3</sub>	132.05299	132.05348	3.71	8.31
6026	L-Ornithine	C <sub>5</sub> H <sub>12</sub> N <sub>2</sub> O <sub>2</sub>	132.08987	132.08988	0.02	10.37
64236	D-Ornithine	C <sub>5</sub> H <sub>12</sub> N <sub>2</sub> O <sub>2</sub>	132.08987	132.08988	0.02	10.37
5746	Glutamine	C <sub>5</sub> H <sub>10</sub> N <sub>2</sub> O <sub>3</sub>	146.06914	146.06900	0.93	8.25
128633	D-Glutamine	C <sub>5</sub> H <sub>10</sub> N <sub>2</sub> O <sub>3</sub>	146.06914	146.06900	0.93	8.25
141172	Ureidoisobutyric acid	C <sub>5</sub> H <sub>10</sub> N <sub>2</sub> O <sub>3</sub>	146.06914	146.06900	0.93	8.25
21436	N-Methyl- <scp>D</scp> -aspartic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05300	1.13	8.06
21814	D-(-)-Glutamic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05300	1.13	8.06
30572	L-(+)-Glutamic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05300	1.13	8.06
58744	N-Acetyl-L-serine	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05300	1.13	8.06
5907	L-(-)-methionine	C <sub>5</sub> H <sub>11</sub> NO <sub>2</sub> S	149.05106	149.05095	0.70	7.39
6038	Histidine	C <sub>6</sub> H <sub>9</sub> N <sub>3</sub> O <sub>2</sub>	155.06947	155.06940	0.48	8.33
5910	L-(-)-Phenylalanine	C <sub>9</sub> H <sub>11</sub> NO <sub>2</sub>	165.07898	165.07887	0.63	6.60
1025	Pyridoxine	C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub>	169.07390	169.07376	0.80	3.24



4463	Oxidopamine [USAN:INN]	C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub>	169.07390	169.07376	0.80	3.24
102750	5-(2-aminoethyl)- Pyrogallol	C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub>	169.07390	169.07376	0.80	3.24
388394	Norepinephrine	C <sub>8</sub> H <sub>11</sub> NO <sub>3</sub>	169.07390	169.07376	0.80	3.24
6082	L-(+)-Arginine	C <sub>6</sub> H <sub>14</sub> N <sub>4</sub> O <sub>2</sub>	174.11168	174.11144	1.39	10.77
64224	D-Arg	C <sub>6</sub> H <sub>14</sub> N <sub>4</sub> O <sub>2</sub>	174.11168	174.11144	1.39	10.77
780	heteroauxin	C <sub>10</sub> H <sub>9</sub> NO <sub>2</sub>	175.06300	175.06304	0.18	2.32
67261	Indole-3- acetaldehyde, 5- hydroxy-	C <sub>10</sub> H <sub>9</sub> NO <sub>2</sub>	175.06332	175.06304	1.65	2.32
3574185	INDOLE-2-ACETIC ACID	C <sub>10</sub> H <sub>9</sub> NO <sub>2</sub>	175.06332	175.06304	1.65	2.32
5833	L-(-)-Tyrosine	C <sub>9</sub> H <sub>11</sub> NO <sub>3</sub>	181.07390	181.07378	0.66	7.48
389285	3-Amino-3-(4- hydroxyphenyl)propa acid	C <sub>9</sub> H <sub>11</sub> NO <sub>3</sub> anoic	181.07390	181.07378	0.66	7.48
13628311	L-threo-3- phenylserine	C <sub>9</sub> H <sub>11</sub> NO <sub>3</sub>	181.07390	181.07378	0.66	7.48
425	4-hydroxy-4-(3- pyridyl)butanoic acid	C <sub>9</sub> H <sub>11</sub> NO <sub>3</sub>	181.07401	181.07378	1.25	7.48
13899	3-(1H-Indol-3- yl)acrylic acid	C <sub>11</sub> H <sub>9</sub> NO <sub>2</sub>	187.06332	187.06330	0.15	6.44
10607876	Indoleacrylic acid	C <sub>11</sub> H <sub>9</sub> NO <sub>2</sub>	187.06332	187.06330	0.15	6.44
389120	N6,N6,N6- Trimethyl-L-lysine	C <sub>9</sub> H <sub>20</sub> N <sub>2</sub> O <sub>2</sub>	188.15248	188.15221	1.45	10.87
388321	5"-S-Methyl-5"- thioadenosine	C <sub>11</sub> H <sub>15</sub> N <sub>5</sub> O <sub>3</sub> S	297.08957	297.08898	2.00	2.56
144	9-(5-s-methyl-5- thiopentofuranosyl)- purin-6-amine	C <sub>11</sub> H <sub>15</sub> N <sub>5</sub> O <sub>3</sub> S 9h-	297.09000	297.08898	3.43	2.56
111188	Glutathione	C <sub>10</sub> H <sub>17</sub> N <sub>3</sub> O <sub>6</sub> S	307.08380	307.08345	1.14	8.02

## Table 2A.

CSID	Name	Formula	Monoisotopic Mass	Search Mass	Error (ppm)	R.T. (min)
857	Methylglyoxal	C <sub>3</sub> H <sub>4</sub> O <sub>2</sub>	72.02100	72.02108	1.03	7.70
1057	Sarcosine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04768	89.04747	2.33	8.19
5735	alanine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04768	89.04747	2.33	8.19
234	beta-Alanine	C <sub>3</sub> H <sub>7</sub> NO <sub>2</sub>	89.04800	89.04747	5.93	8.19
55423	R-lactic acid	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03169	90.03143	2.91	5.12
61460	Hydroxypropionic acid	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03169	90.03143	2.91	5.12
96860	L-(+)-lactic acid	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03169	90.03143	2.91	5.12
592	Lactic acid	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03200	90.03143	6.29	5.12
650	Dihydroxyacetone	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03200	90.03143	6.29	5.12
731	Glyceraldehyde	C <sub>3</sub> H <sub>6</sub> O <sub>3</sub>	90.03200	90.03143	6.29	5.12
1086	Sulfuric acid	H <sub>2</sub> O <sub>4</sub> S	97.96738	97.96683	5.63	8.13
128566	Proline	C <sub>5</sub> H <sub>9</sub> NO <sub>2</sub>	115.06333	115.06302	2.67	7.78
1078	Succinic acid	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	118.02661	118.02630	2.66	7.72

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466979	Erythrono-1,4- lactone	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	118.02661	118.02630	2.66	7.72
4483398	D-Erythronic g- lactone	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	118.02661	118.02630	2.66	7.72
473	Methylmalonic acid	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	118.02700	118.02630	5.96	7.72
8527138	(3S,4R)-3,4- Dihydroxydihydrofur one	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub> an-2(3H)-	118.02700	118.02630	5.96	7.72
140384	2-ketocaproic acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06299	130.06270	2.24	2.35
164251	Methyloxovaleric acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06299	130.06270	2.24	2.35
388419	(3S)-3-Methyl-2- oxopentanoic acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06299	130.06270	2.24	2.35
15642233	Ketoleucine	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06299	130.06270	2.24	2.35
46	a-Oxo-b- methylvaleric acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06300	130.06270	2.36	2.35
69	Alpha- ketoisocaproic acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	130.06300	130.06270	2.36	2.35
134	Aminolevulinic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05800	131.05795	0.36	8.19
9312313	3-Hydroxy-L- proline	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05800	131.05795	0.36	8.19
5605	HYDROXYPROLINE	C₅H <sub>9</sub> NO₃	131.05824	131.05795	2.23	8.19
7068	N-Acetylalanin	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05795	2.23	8.19
79449	Ac-Ala-OH	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05795	2.23	8.19
89122	Ethylformylglycine	C₅H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05795	2.23	8.19
167744	I-Glutamic-gamma- semialdehyde	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05795	2.23	8.19
388519	5-Amino-2- oxopentanoic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>3</sub>	131.05824	131.05795	2.23	8.19
5880	L-(+)-Leucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09419	3.39	7.09
6067	L-(+)-Isoleucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09419	3.39	7.09
19964	L-Norleucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09419	3.39	7.09
388796	beta-Leucine	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09464	131.09419	3.39	7.09
548	Aminocaproic acid	C <sub>6</sub> H <sub>13</sub> NO <sub>2</sub>	131.09500	131.09419	6.18	7.09
109	Ureidopropionic acid	C <sub>4</sub> H <sub>8</sub> N <sub>2</sub> O <sub>3</sub>	132.05299	132.05321	1.60	8.28
6031	L-(-)-Asparagine	C <sub>4</sub> H <sub>8</sub> N <sub>2</sub> O <sub>3</sub>	132.05350	132.05321	2.21	8.28
6026	L-Ornithine	C <sub>5</sub> H <sub>12</sub> N <sub>2</sub> O <sub>2</sub>	132.08987	132.08961	1.98	10.36
64236	D-Ornithine	C <sub>5</sub> H <sub>12</sub> N <sub>2</sub> O <sub>2</sub>	132.08987	132.08961	1.98	10.36
193317	L-(-)-Malic acid	C₄H <sub>6</sub> O <sub>5</sub>	134.02153	134.02130	1.72	7.95
510	(±)-Malic Acid	C <sub>4</sub> H <sub>6</sub> O <sub>5</sub>	134.02200	134.02130	5.25	7.95
133224	threonic acid	C₄H <sub>8</sub> O <sub>5</sub>	136.03717	136.03688	2.14	7.70
388628	2,3,4- Trihydroxybutanoic acid	C <sub>4</sub> H <sub>8</sub> O <sub>5</sub>	136.03717	136.03688	2.14	7.70
2061231	DL-erythronic acid	C <sub>4</sub> H <sub>8</sub> O <sub>5</sub>	136.03717	136.03688	2.14	7.70
21436	N-Methyl- <scp>D</scp> -aspartic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05299	1.16	8.05
21814	D-(-)-Glutamic acid	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05299	1.16	8.05



30572	L (I) Clutomic soid	CILNO	147.05316	147.05299	1.16	8.05
58744	` '	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	147.05316	147.05299	1.16	8.05
6038	N-Acetyl-L-serine	C <sub>5</sub> H <sub>9</sub> NO <sub>4</sub>	155.06947	155.06930	1.09	8.36
	Histidine	C <sub>6</sub> H <sub>9</sub> N <sub>3</sub> O <sub>2</sub>				
199	Allantoin	C <sub>4</sub> H <sub>6</sub> N <sub>4</sub> O <sub>3</sub>	158.04401	158.04387	0.88	4.76
6082	L-(+)-Arginine	C <sub>6</sub> H <sub>14</sub> N <sub>4</sub> O <sub>2</sub>	174.11168	174.11154	0.80	10.76
64224	D-Arg	C <sub>6</sub> H <sub>14</sub> N <sub>4</sub> O <sub>2</sub>	174.11168	174.11154	0.80	10.76
58576	N-Acetyl-L-Aspartic acid	C <sub>6</sub> H <sub>9</sub> NO <sub>5</sub>	175.04807	175.04803	0.18	7.87
996	Pyrophosphoric Acid	H <sub>4</sub> O <sub>7</sub> P <sub>2</sub>	177.94299	177.94331	1.79	8.42
5589	Glucose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
17893	Mannose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
58238	.betaD- Glucopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
71358	.alphaD- Glucopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
134838	3-deoxy-arabino- hexonic acid	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
388332	L-Sorbopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
388476	beta-D- galactopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
388480	.alphaD- Galactopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
388775	beta-D- Fructofuranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
10239179	Inositol	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
16736992	Cis-inositol	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
17216070	allose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
17216093	L-Sorbose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06339	180.06346	0.41	7.53
201	hexopyranose	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06300	180.06346	2.53	7.53
868	1,2,3,4,5,6- cyclohexanhexol	C <sub>6</sub> H <sub>12</sub> O <sub>6</sub>	180.06300	180.06346	2.53	7.53
2068	Theophylline	C <sub>7</sub> H <sub>8</sub> N <sub>4</sub> O <sub>2</sub>	180.06473	180.06346	7.04	7.53
4525	1,7-dimethyl- Xanthine	C <sub>7</sub> H <sub>8</sub> N <sub>4</sub> O <sub>2</sub>	180.06473	180.06346	7.04	7.53
5236	Theobromine	C <sub>7</sub> H <sub>8</sub> N <sub>4</sub> O <sub>2</sub>	180.06473	180.06346	7.04	7.53
1161	isocitric acid	C <sub>6</sub> H <sub>8</sub> O <sub>7</sub>	192.02701	192.02704	0.15	8.18
305	Citric acid	C <sub>6</sub> H <sub>8</sub> O <sub>7</sub>	192.02699	192.02704	0.23	8.18
963	pantothenic acid	C <sub>9</sub> H <sub>17</sub> NO <sub>5</sub>	219.11067	219.11049	0.84	6.72
6361	D-pantothenic acid	C <sub>9</sub> H <sub>17</sub> NO <sub>5</sub>	219.11067	219.11049	0.84	6.72
960	palmitic acid	C <sub>16</sub> H <sub>32</sub> O <sub>2</sub>	256.23999	256.24000	0.05	1.73
111188	Glutathione	C <sub>10</sub> H <sub>17</sub> N <sub>3</sub> O <sub>6</sub> S	307.08380	307.08339	1.35	8.03
388337	N-Acetylneuraminic acid		309.10599	309.10585	0.45	7.43
392681	N-Acetyl-alpha- neuraminic acid	C <sub>11</sub> H <sub>19</sub> NO <sub>9</sub>	309.10599	309.10585	0.45	7.43
392810		C <sub>11</sub> H <sub>19</sub> NO <sub>9</sub>	309.10599	309.10585	0.45	7.43
						<u> </u>

Table 2B.

**Table 2. List of untargeted metabolites detected in HCT 8 cells (2.78 x 10<sup>5</sup> cells equivalence).** Table 2A and 2B include components extraction information: retention time, m/z and mass error, and meanwhile, database search results: Chemspider ID (CSID), name, formula, and so on. Here the samples analyzed are equal to metabolites extracted from 2.78 x 10<sup>5</sup> cells, and the intensity threshold is 1 x 10<sup>7</sup> to avoid tedious result for demonstration aim.

#### **Discussion**

The most critical steps for successful metabolite profiling in cells using this protocol are: 1) controlling the growth medium and careful extraction of the cells; 2) adjusting the LC method based on MS method setup to ensure there are enough (usually at least 10) data points across a peak for quantitation; 3) doing a low mass calibration before running samples; 4) injecting no more than 5 ml to avoid retention time shifting and peak broadening caused by water; and 5) preparing and running samples for comparison in the same batch to minimize batch effects.

The standards (**Table 1**) chosen here for low mass range calibration are interchangeable. Any known compound with an m/z that falls into the mass scan range, is well behaved in a H-ESI source, and is soluble in water, methanol, or acetonitrile are reasonable candidates for calibration standards. It is highly recommended to store all calibration solutions at 4 °C to stabilize caffeine and also to minimize the evaporation of methanol or acetonitrile in the calibration solution so that the calibration performance can be more reproducible. Compared to a regular mass range, m/z from 150 to 2,000, low mass range calibration needs to be done more frequently, at least once every two days.

This workflow, from extraction solvent, reconstitution solvent, LC mobile phase, to low mass range calibration and MS scan range has been optimized to measure polar metabolites. This includes amino acids, acetyl amino acids, glycolysis pathway intermediates, nucleosides, TCA cycle intermediates, some one-carbon metabolism pathway intermediates and so on. However, modifications of this protocol for other classes of metabolites, such as Coenzyme A (CoA) species, folates, phospholipids are possible. For example, CoAs are more stable in acidic conditions, so the addition of an acid to 80% methanol/water will be helpful to improve CoA sensitivity. Also, CoAs and lipids tend to have much large molecular weights, thus the m/z scan range needs to be adjusted from 60-900 to the proper range which will cover those metabolites.

Even though some of the untargeted component database search results overlap with the targeted list, it is still of importance to build this targeted list based on the research priority. Since the metabolites in the targeted list are lower than the average intensity threshold, information on these metabolites will be removed during processing. The targeted list includes the retention time information, which gives us higher confidence for metabolite identification and quantitation. One further advantage with the QE-MS setup is that tandem mass spectrometry can allow for further identification of metabolites.

One issue associated with this workflow is that the H-ESI needle insert is sensitive to the salt content of the samples, as the sensitivity will be greatly compromised if there are high amounts of non-volatile salts. Therefore, minimizing salt content from samples, and routine cleaning of the column and the H-ESI needle insert will be helpful to ensure good quality data and to increase the column's lifetime.

In summary, this protocol employs LC-QE-MS to successfully analyze polar metabolites from cultured cells, with minimal sample preparation steps and rapid data acquisition. Small modifications in sample preparation can be carried out to obtain data from other biological sources such as serum and tissue. For example, since pure methanol can be added to liquid serum added to make a final methanol concentration to 80% for polar metabolites extraction. For tissue samples, rigorous stirring and mixing is required to achieve better extraction efficiency. Usually 10 ml serum or 1 mg tissue is sufficient for metabolites analysis. The raw data can be analyzed both in targeted mode, if there are known metabolites in the samples, and in an un-targeted way followed by HRMS database searching. HRMS based metabolomics is still in its early stages. For future advances, the experimental techniques can be further optimized, additional metabolite HRMS information and MS/MS fragmentation patterns will be helpful and relevant algorithms, such as peak alignment, peak integration, isotope clustering and so on, can improve the efficiency and accuracy of data processing. Ultimately, however, many of the questions that our lab addresses in metabolism are limited by careful interpretation of data after processing. With these large-scale metabolomics techniques, we are often limited by our interpretation of the data and evaluation of hypotheses generated. Therefore, all metabolomics experiments need be formulated around specific questions.

### **Disclosures**

The authors declare no conflicts of interest.

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