



# Metabolomics Batch Data Analysis Workflow to Characterize Differential Metabolites in Bacteria

## Application Note

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### Abstract

An accurate mass Q-TOF LC/MS workflow for discovery metabolomics was used to study a bacterium in early and late stationary phases. The use of software that can process data in batch-mode made the data analysis more efficient and automated. A total of 488 features from the positive ion data and 623 features from the negative ion data were found using Agilent MassHunter Profinder (batch feature extraction software). Statistical analyses using Mass Profiler Professional (MPP) revealed features whose abundance differed significantly in early stationary phase versus late stationary phase. From the positive ion data, 57 features were found to have higher abundances in the early stationary phase than in the late stationary phase. While in the negative ion data, 52 features exhibited higher abundances in the early stationary phase compared to the late stationary phase. To understand the biological and biochemical context of the metabolomics data, we annotated and identified over 100 differential features using database searching, accurate mass MS/MS library matching, and MS/MS molecular structure correlation.



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## Introduction

The growth of bacteria has been studied for more than a century, including the now classical definition of the phases of growth identified by Jacob Monod<sup>1</sup>. It was found that cells remain alive and metabolically active during the late stationary phase, but often respond differently to stimuli or stresses during the early part of stationary phase compared to the late stationary phase. Researchers hypothesize that one or more metabolites produced during the stationary phase may render a bacterium less viable in late stationary phase or, alternatively, that a protective metabolite may be lost during the progression of stationary phase. To our knowledge, there is no information available about the characteristics of those metabolites.

Here we present a Q-TOF LC/MS metabolomics approach to investigate differential metabolites of a bacterium in the early stationary versus late stationary phase. The Agilent suite of data processing software makes feature finding, statistical analysis, and identification easier. This enables rapid transformation of complex raw data into biologically relevant metabolite information.

## Experimental

### Sample preparation

Cell cultures were harvested either in early or late stationary phase, rinsed twice with phosphate-buffered saline to remove any residual extracellular media, and then rinsed with water to remove the buffer. The suspended cells were then centrifuged to form a pellet and the water was decanted. To the cell pellets was added 0.5 mL of MeOH at  $-80\text{ }^{\circ}\text{C}$  and then 1.5 mL of 50 % MeOH/ $\text{H}_2\text{O}$  at  $4\text{ }^{\circ}\text{C}$ . The cells were mechanically lysed, and the crude extract was spun at 48,000 g for 1 hour, then the supernatant was collected. An aliquot of 500  $\mu\text{L}$  of supernatant was added to a 3 kDa Nanosep filter and spun at 14,000 g, the filtrate was collected, vacuum dried, and held at  $\leq -60\text{ }^{\circ}\text{C}$  until analysis.

For LC/MS analysis, the sample was resuspended in 500  $\mu\text{L}$  of water/acetonitrile (3:7 v/v) solvent, then vortexed and centrifuged. The supernatant was transferred from an Eppendorf tube to a clean LC/MS vial.

### Instrumentation

LC/MS Analysis was performed using an Agilent 1290 Infinity LC system coupled to either an Agilent 6230 TOF system or an Agilent 6550 iFunnel Q-TOF system. The LC system consisted of the following modules:

- Agilent 1290 Infinity Binary Pump (G4220A)
- Agilent 1290 Infinity Autosampler with a thermostat (G4226A)
- Agilent 1290 Infinity Thermostatted Column Compartment (G1316C)
- Agilent 1100 Series Isocratic Pump (G1310) with a 100:1 splitter (p/n G1607-60000)

Dynamic mass axis calibration was achieved by continuous infusion of a reference mass solution using the isocratic pump. Tables 1 and 2 summarize the optimized LC and MS conditions.

### Data analysis software

- Agilent MassHunter Qualitative Analysis (Qual) B.07.00
- Agilent MassHunter Profinder B.06.00, service pack 1
- Agilent Mass Profiler Professional (MPP) B.13.0
- Agilent MassHunter Molecular Structure Correlator (MSC) B.07.00
- Pathway to PCDL B.07.00

Table 1. LC parameters.

Parameter	Agilent 1290 Infinity LC system
Analytical column	Cogent Diamond Hydride HPLC Column, $2.1 \times 150\text{ mm}$ , $4\text{ }\mu\text{m}$ , 100 Å (p/n 70000-15P-2), Microsolv Technology Corporation
Guard column	Agilent ZORBAX SB-C8, $2.1 \times 30\text{ mm}$ , $3.5\text{ }\mu\text{m}$ (p/n 827700-936)
Column temperature	$60\text{ }^{\circ}\text{C}$
Injection volume	5 $\mu\text{L}$ for profiling experiment on the Agilent 6230 TOF 10 $\mu\text{L}$ for identification experiment on the Agilent 6550 Q-TOF
Autosampler temperature	$4\text{ }^{\circ}\text{C}$
Mobile phase for positive ion mode	A) 50 % water/50 % isopropanol containing 0.1 % formic acid B) 3 % water/97 % acetonitrile containing 0.1 % formic acid
Mobile phase for negative ion mode	A) 50 % water/50 % isopropanol/0.025 % formic acid and 5 $\mu\text{M}$ EDTA B) 10 % water/90 % acetonitrile/5 mM ammonium formate/5 $\mu\text{M}$ EDTA, pH=7
Flow rate	0.6 mL/min
Gradient for positive ion mode	0–1 minutes 97 %B 1–15 minutes 97 %B to 10 %B
Gradient for negative ion mode	0–1 minutes 99 %B 1–15 minutes 99 %B to 20 %B
Stop time	15 minutes
Post time	5 minutes

## LC/MS metabolomics workflow

A high-resolution Q-TOF LC/MS metabolomics workflow (Figure 1) was developed for unbiased metabolomics study of a bacterium in the early stationary and late stationary phase. The workflow was as follows:

1. Acquire data from extracts in TOF mode in positive and negative ion modes, respectively.
2. Find features from raw data using the Agilent MassHunter Profinder<sup>2</sup> Batch Recursive Feature Extraction algorithm.
3. Perform differential analysis and annotation using MPP.
4. Conduct targeted MS/MS analysis of the differential features of interest using Q-TOF LC/MS.
5. Use Qualitative Analysis for metabolite identification based on MS/MS spectra matches or use Molecular Structure Correlator (MSC) software to aid structural elucidation of putative metabolites.

Table 2. MS parameters.

Parameter	Agilent 6230 TOF system
Ion mode	Positive and Negative
Source	Agilent Dual ESI
Capillary voltage	3,500 V ( $\pm$ )
Dry gas temperature	350 °C
Dry gas flow	10 L/min
Nebulizer pressure	45 psi
Fragmentor	100 V
MS range	25–1,600 <i>m/z</i>
MS acquisition rate	2 spectra/sec
Reference mass	Positive ion mode: 64.01577 and 922.009798 Negative ion mode: 68.9957 and 966.0007
Reference pump flow	0.5 mL/min (positive and negative ion modes)
Reference delivery	Agilent 1100 isocratic pump with 100:1 splitter (p/n G1607-60000)
Instrument mode	Extended dynamic range (2 GHz)
Parameter	Agilent 6550 Q-TOF system
Ion mode	Positive and Negative
Source	Agilent Dual ESI
Capillary voltage	3,500 V ( $\pm$ )
Dry gas temperature	200 °C
Dry gas flow	15 L/min
Nebulizer pressure	45 psi
MS range	50–1,700 <i>m/z</i>
MS acquisition rate	3 spectra/sec
MS/MS range	25–1,700 <i>m/z</i>
MS/MS acquisition rate	2 spectra/sec, Targeted MS/MS
Isolation width	Medium (~4 <i>m/z</i> )
Collision energy	10–40 eV
Reference mass	Positive ion mode: 64.01577 and 922.009798 Negative ion mode: 68.9957 and 1033.9881
Reference pump flow	0.6 mL/min (positive ion mode) 0.5 mL/min (negative ion mode)
Reference delivery	Agilent 1100 Isocratic Pump with 100:1 splitter (p/n G1607-60000)
Instrument mode	Extended dynamic range (2 GHz)

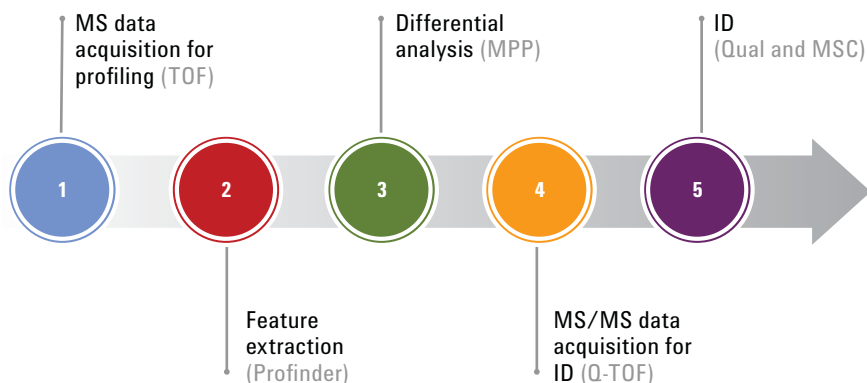


Figure 1. LC/MS metabolomics workflow for profiling and identification of bacterium metabolites.

## Results and Discussion

### Metabolite profiling by TOF LC/MS

In principle, either a TOF or a Q-TOF can be used for metabolite profiling. If a laboratory only has one instrument, a Q-TOF is the preferred instrument due to its capability to perform both profiling and MS/MS analysis for identification. However, if laboratory sample volume requires multiple instruments, a combination of TOF and Q-TOF instrumentation is more cost-effective. For this study, we demonstrate the use of 6230 TOF for profiling and 6550 Q-TOF for identification.

The difference in the metabolome of a bacterium in the early versus late stationary phase was assessed by performing metabolite profiling on cell extracts of 10 separate cultures from the early stationary phase and 9 cultures from the late stationary phase. A 6230 TOF LC/MS was used to profile these samples in positive and negative ion modes. Chromatographic separation used an aqueous normal phase (ANP) column to maximize polar metabolite coverage. Figure 2 shows the metabolite profiling results of the cell extracts obtained in the negative ion mode. An overlay of 38 total ion chromatograms (TICs) from 19 cell extracts shows minimal retention time variation across the chromatograms. The reproducibility of retention time is crucial in discovery metabolomics studies, because it is used for peak matching across different samples.

### Batch data feature extraction using Agilent MassHunter Profinder

One of the bottlenecks in metabolomics data analysis is the time-consuming feature extraction from large amounts of complex raw data. MassHunter Profinder Software was designed to increase throughput using automated batch data

processing. In this study, Profinder found 488 features from the positive ion data, and 623 features from the negative ion data (Figure 3) based on the user-defined compound filtering criteria and manual curation. The resulting features were subsequently imported into MPP (B.13.0) for differential analysis.

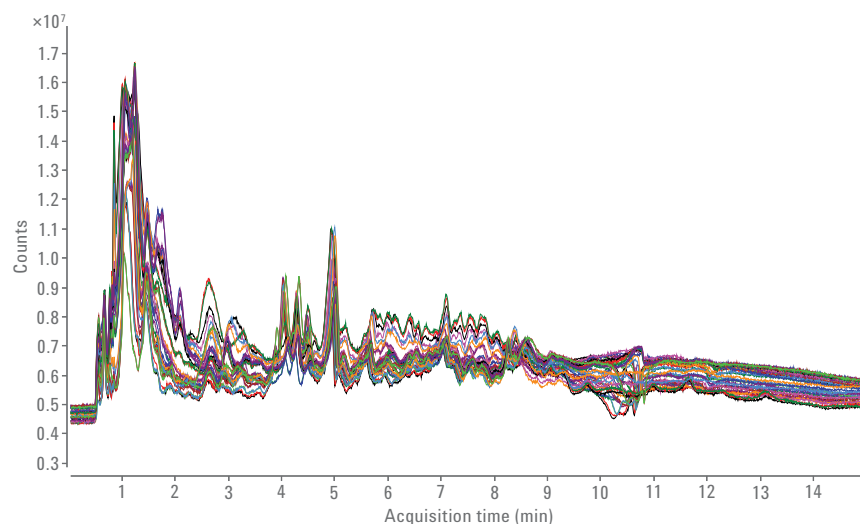


Figure 2. Thirty-eight overlaid total ion chromatograms (TICs) from 19 cell extracts in ESI negative ion mode. Each sample was injected twice.

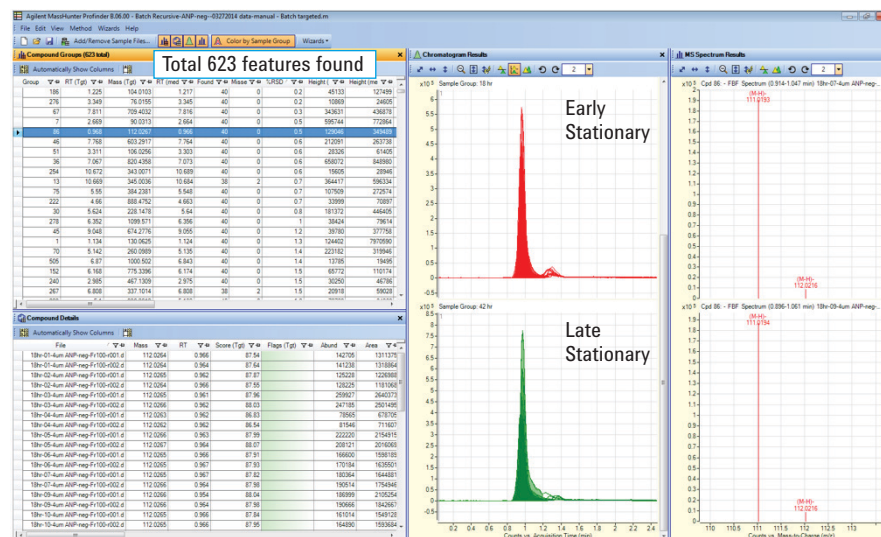


Figure 3. Untargeted feature extraction result of the negative ion MS data from the cell extracts in the early and late stationary phase using the Profinder Batch Recursive Feature Extraction algorithm.

## Differential analysis and annotation using MPP

To determine the differential features of a bacterium in the early versus late stationary phase, the resulting features were evaluated by MPP using the *Filter on Volcano Plot* algorithm with a cutoff of  $P < 0.005$  and fold change (FC)  $> 2$ . The statistical results yielded features whose abundance differed significantly in the early stationary versus late stationary phase. For the positive ion data, 98 of the 488 features displayed statistical significance, and 57 of them were found to have higher abundances in the early stationary phase compared to the late stationary phase. Likewise, we detected 152 of 623 features that were significantly differential in the negative ion data (Figure 4), and 52 of them had higher abundance in the early stationary than in the late stationary phase (blue solid square dots).

To understand the biological and biochemical context of the metabolomics data, we performed annotation for those differential features using the ID browser tool in MPP and accurate mass database matches with 10 ppm mass tolerance. The three databases that were queried were Agilent-Metlin, KEGG, and BioCyc. Both the KEGG and BioCyc databases were created using Agilent Pathway to PCDL software. Figure 5 shows the ID browser result for a set of differential features acquired in the negative ion mode. By clicking a compound, in this case L-Leucine, in the compound list table, the corresponding MS spectrum results, detailed information of isotopic peaks, and chemical structure are displayed. Users can quickly review and rank hits based on parameters such as accurate mass, isotopic pattern, retention time, and match scores to select the best hit for annotation.

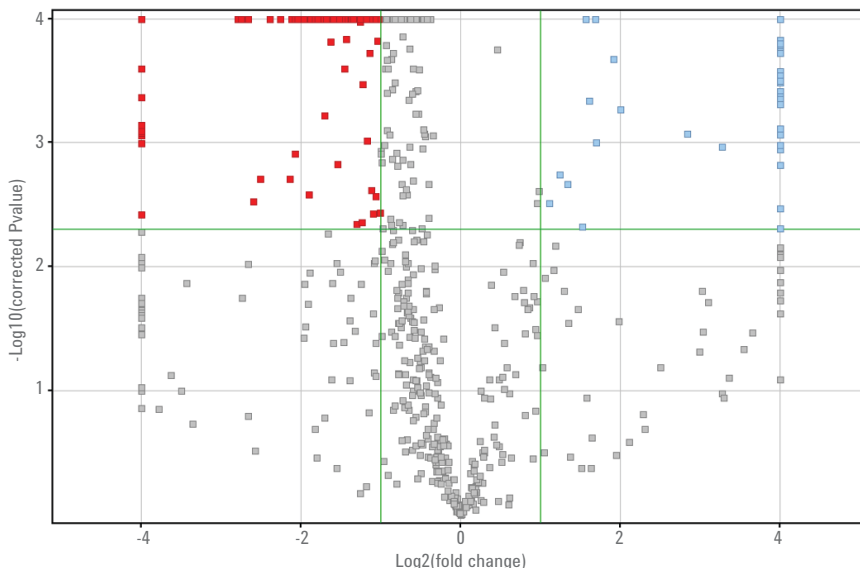


Figure 4. Volcano plot of the features in the early versus the late stationary phase (negative ion data). Red dots represents those features whose abundances are lower in the early stationary phase than in the late stationary phase ( $P < 0.005$ ,  $FC > 2$ ). Blue dots represents those features whose abundances are higher in the early stationary phase than in the late stationary phase ( $P < 0.005$ ,  $FC > 2$ ).

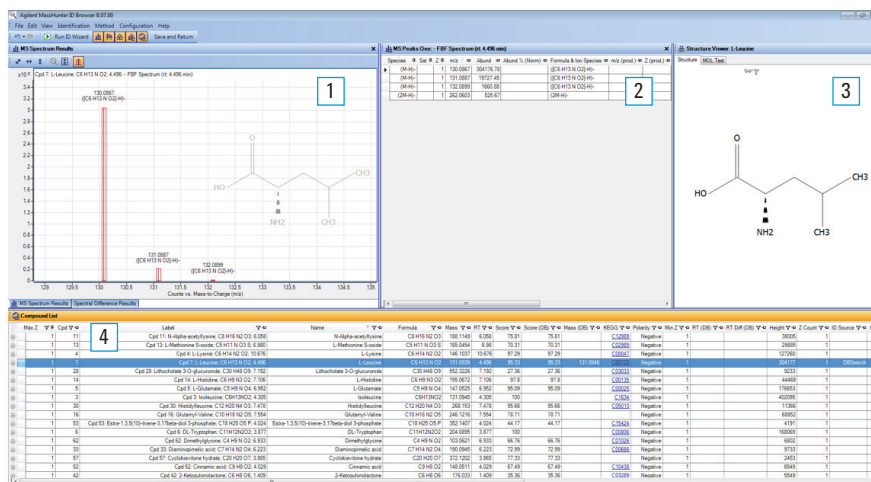


Figure 5. ID browser result for a set of differential features detected in the negative ion mode. (1) MS spectrum result, (2) detail information of isotopic peak, (3) structure of the annotated compound, and (4) compound list.

## Compound identification and software-assisted structure elucidation

To validate the initial annotations, targeted MS/MS experiments were performed for those differential features of interest using a 6550 Q-TOF LC/MS. Compound identification and structure elucidation were achieved using two approaches. First, LC/MS/MS data were processed using the *Find by Targeted MSMS* tool in the MassHunter Qualitative Analysis software. The MS/MS spectrum generated was then compared to the Agilent-Metlin metabolite library containing accurate mass MS/MS information. Figures 6 and 7 showed a differential feature that was identified as nicotinic acid with high confidence. The mirror image plot (middle) showed excellent matches of the acquired sample spectrum (top) with the library standard spectrum (bottom) for both  $m/z$  values and abundances of the precursor and fragment ions with reverse match scores of 97 for the positive ion data and 99 for the negative ion data.

When an acquired MS/MS spectrum had poor or no matches to the Agilent-Metlin MS/MS library, the other approach using MSC software was employed. MSC<sup>3</sup> proposes theoretical fragment masses from proposed molecular structures by using a systematic bond-breaking approach. It then correlates those theoretical fragment masses with the observed accurate mass fragment ions for a compound of interest. MSC calculates an overall correlation score (goodness-of-fit) from the individual score for each fragment ion; one or multiple substructure candidates may be suggested.

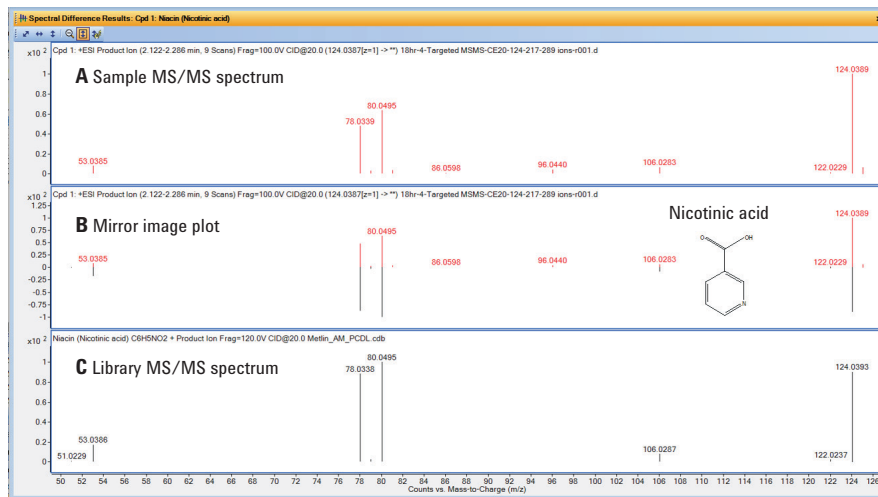


Figure 6. Compound structure identification using MS/MS spectra matching with a reverse match score of 97 for nicotinic acid in positive ESI mode. The reverse score reflects ion matches for those peaks from the library standards that are reflected in the spectra acquired from the sample. (A) sample MS/MS spectrum, (B) mirror image plot, (C) library MS/MS spectrum. Collision energy (CE) of 20 eV was used to acquire MS/MS spectra.

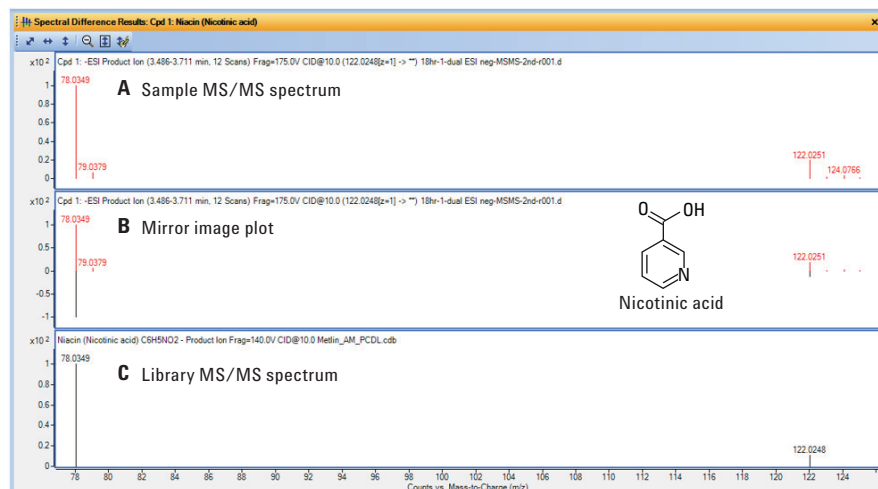


Figure 7. Compound structure identification using the MS/MS spectra matching with a reverse match score of 99 for nicotinic acid in negative ESI mode. The reverse score reflects ion matches for those peaks from the library standards that are reflected in the spectra acquired from the sample. (A) sample MS/MS spectrum, (B) mirror image plot, (C) library MS/MS spectrum. Collision energy (CE) of 10 eV was used to acquire MS/MS spectra.

Multiple data files were batch processed in MSC B.07.00 by searching them against the Agilent-Metlin, the Pathway to PCDL generated KEGG and Biocyc, and web-based PubChem and ChemSpider databases. The ability to search multiple databases increases the chance of finding structure hits, but it comes with the cost of decreasing selectivity. This is shown in Figures 8 and 9, where the Agilent-Metlin database was searched first, and three compounds at  $m/z$  187.1114, 203.1041, and 307.1512 got structure hits (Figure 8). For the  $m/z$  187.1114 ion, nine structures were found. By querying the PubChem database using the same MSC filtering criteria, structure hits were returned for all six compounds (Figure 9) and 300 structures found for the  $m/z$  187.1114 ion. The structure interpretation of the MS/MS spectrum for the  $m/z$  187.1114 ion is shown in Figure 10. All fragment ions were labelled with the most plausible fragment structure proposed by the MSC. Using this approach, we were able to quickly interpret the resulting MS/MS spectra to support annotation for those significant features.

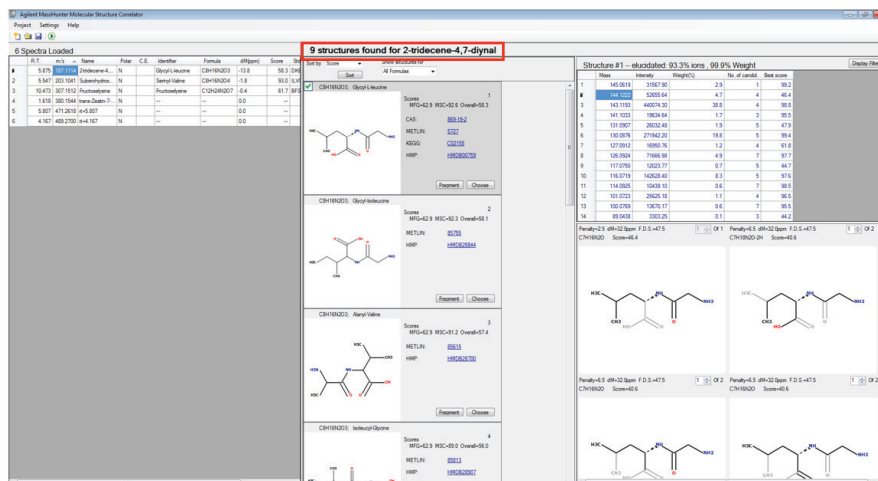


Figure 8. MSC results obtained by searching the Agilent-Metlin database.

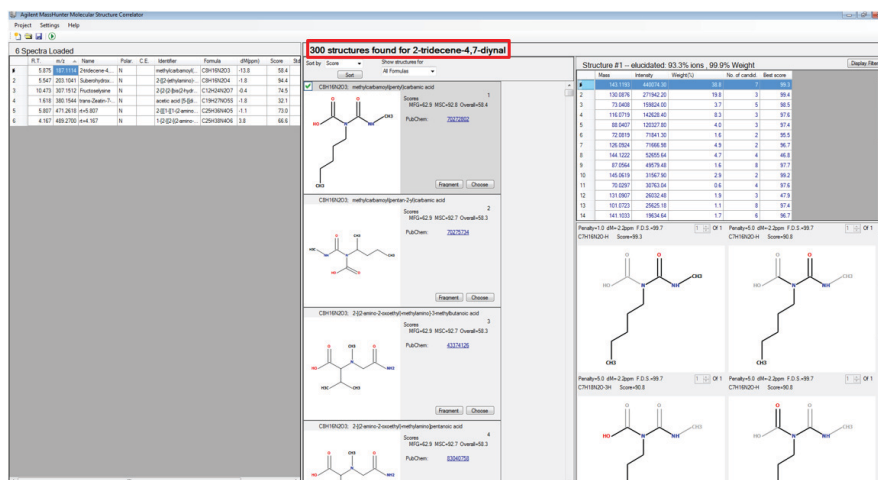


Figure 9. MSC results obtained by searching the web-based PubChem database.

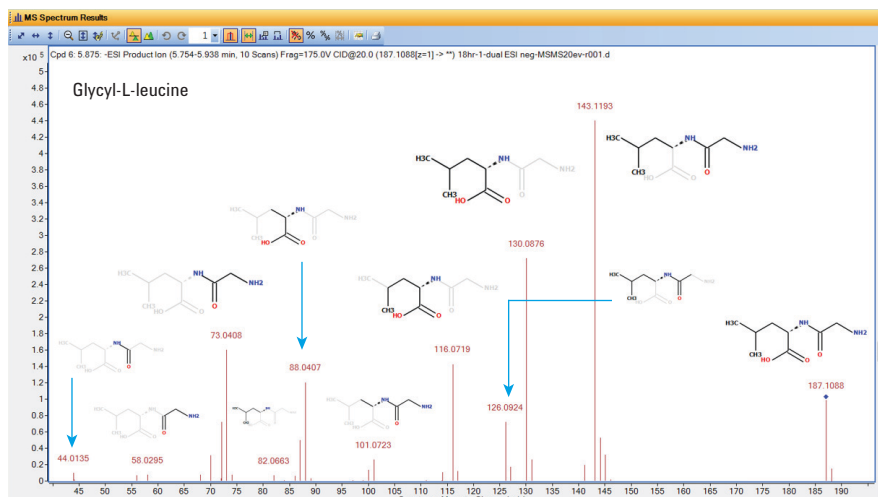


Figure 10. Structure interpretation of MS/MS spectrum for  $m/z$  187.1088 ion using MSC and Agilent-Metlin database.

## Conclusions

An easy-to-use Q-TOF LC/MS based workflow is presented for a discovery metabolomics study of a bacterium. The Agilent software tools (Profinder, MPP, and MSC) enabled high efficiency and high quality feature extraction, statistical analysis, annotation, and identification. The results from this study revealed interesting bacterium metabolic variations in the early versus late stationary phase.

## References

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2. MassHunter Profinder: Batch Processing Software for High Quality Feature Extraction of Mass Spectrometry Data, *Agilent Technologies Technical Overview*, publication number 5991-3947EN, **2014**.
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