

Automated compound identification using product ion scanning with accurate mass measurement and compound database searching for non-targeted metabolomics

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1. Introduction

Non-targeted metabolomics entails data exploration to find the important metabolites from the detected features. Liquid chromatography mass spectrometry (LC-MS) is frequently used for non-targeted metabolomics because of the analytical sensitivity for a wide variety of compounds. In non-targeted metabolomics, compound identification is an important step to translate the information obtained from the instrument such as retention time and *m/z* into

biologically relevant information such as chemical name and structure. We therefore developed a compound identification technique with scoring using both prediction formulae and assignment of product ions for narrowing the candidates. Using this approach, each candidate is evaluated not only using partial structural information from the spectral assignment, but also using all the molecular information provided by formula prediction.

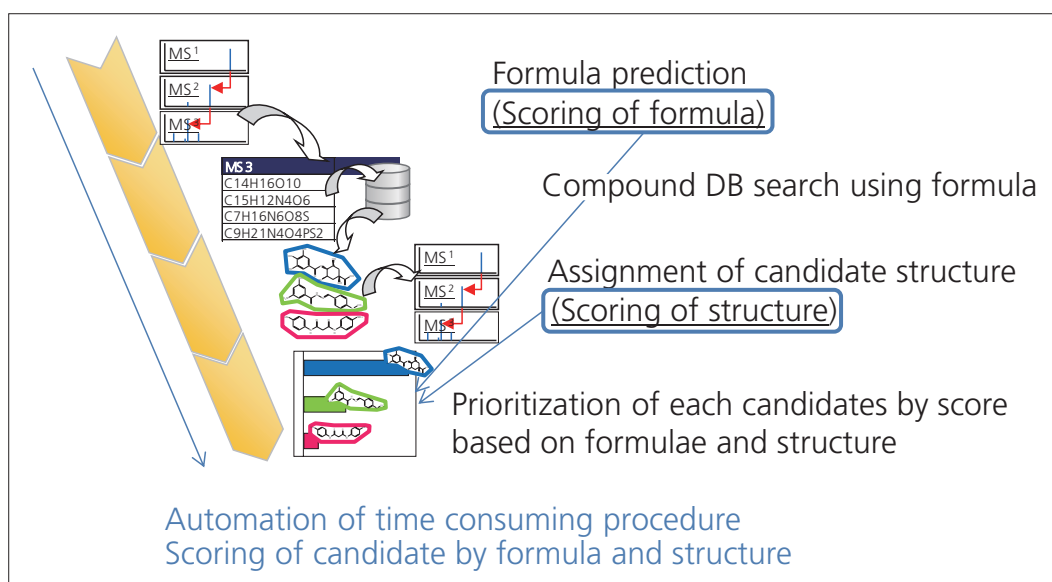


Fig. 1 Schematic view of compound identification system

2. Methods and Materials

To evaluate the developed technique, we used dried green tea leaves which had been ranked by a sensory evaluation test. An aliquot of extracted samples was injected into an LCMS-IT-TOF system (Shimadzu Co.) with an ESI source. We applied this technique to find compounds which are important to the quality of the tea by constructing a quality prediction model using multivariate analysis. Formula Predictor (Shimadzu Co.) was used for formula prediction.

These formulae were then used for database searching by an in-house developed searching interface and Application Programming Interface derived from ChemSpider. After predicting the list of candidate compounds, the score for each candidate was calculated based on mass accuracy and comparison of observed and predicted tandem mass spectra.

Table 1 Analytical conditions

column	: Shim-pack XR-ODS (2.0 mm I.D. × 50 mm L., 2.2 μm)		
mobile phase A	: Water containing 0.1% formic acid		
mobile phase B	: Methanol		
gradient program	: 2%B (0 min) – 60%B (10 min) – 98%B (10.01-14 min) – 2%B (14.01 – 19 min)		
flow rate	: 0.4 mL/min	column temp.	: 40°C
ionization	: ESI (+/- switching)	scan range	: <i>m/z</i> 100 – 1000
CDL temp.	: 200°C	BH temp.	: 200°C

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3. Result

3-1. Chromatograms of green tea extract

3742 peaks were detected from tea extract. These peaks were narrowed to 462 by filtering of isotopic peaks and p-value. This peak set was used to construction of tea quality evaluation model.

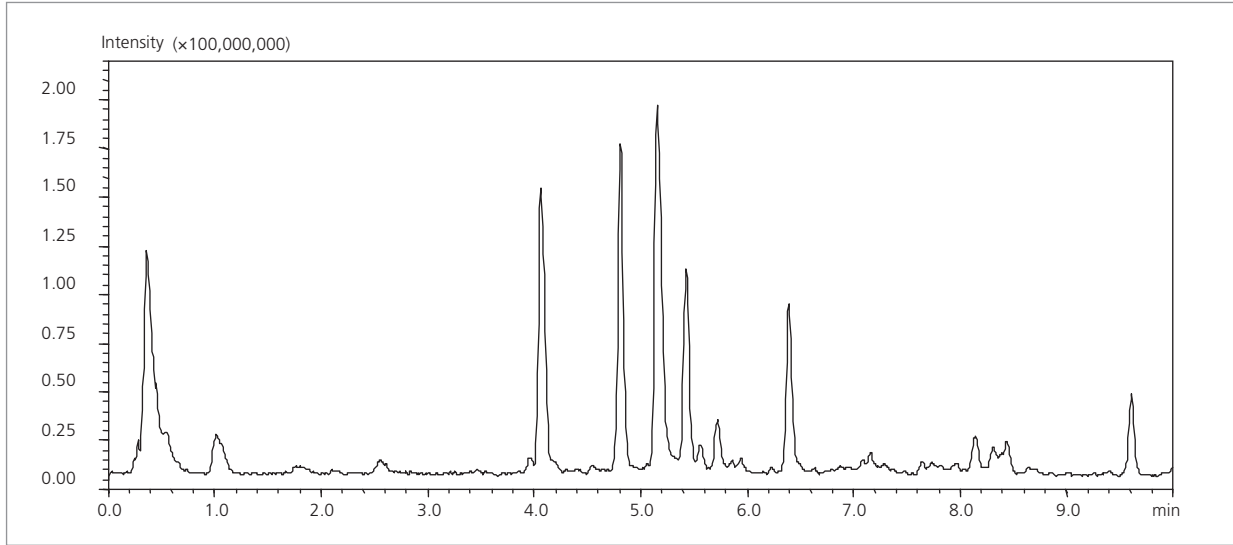


Fig. 2 Typical TIC chromatogram of green tea leaf extract.

3-2. Construction of tea quality evaluation model

To select compounds which shows importance to tea quality, quality evaluation model using PLS regression model were constructed. Compound identification for top 20 compounds which shows highest impact in variable importance in the projection plot were performed.

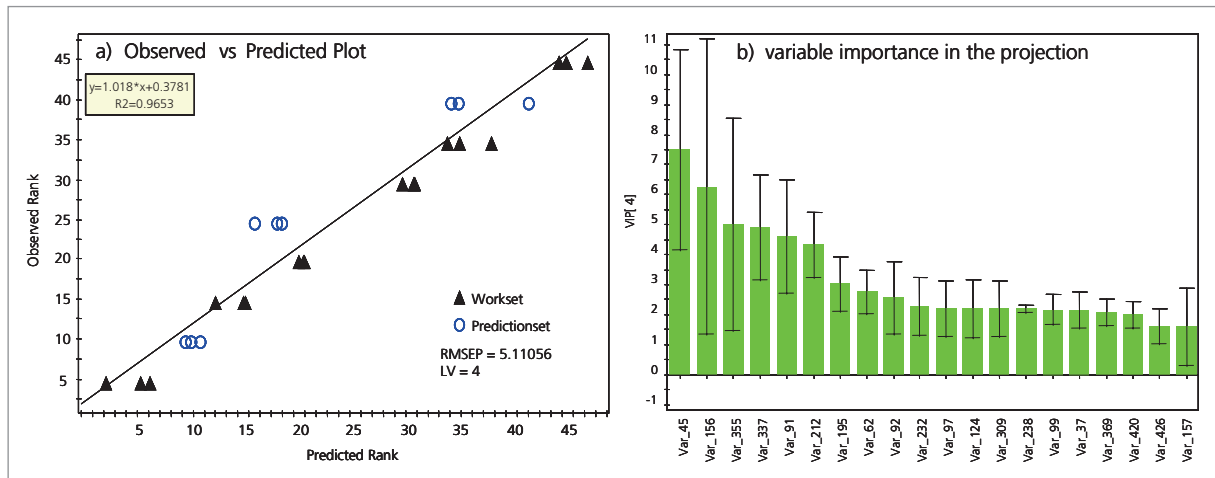


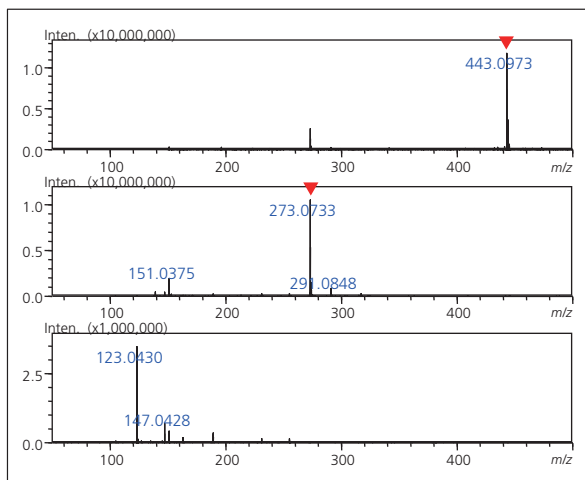
Fig. 3 Quality evaluation model of green tea

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3-3. Compound identification

The result of compound identification for var_337 was shown here as an example. Formula prediction for var_337 was performed using MS¹⁻³ spectra (Figs. 4a-b). The score of the chemical formula (Formula Score) was calculated based on comparison of theoretical and observed *m/z* value and isotopic patterns using Formula Predictor. By using this formula list as a query for database searching, 218 candidate compounds were retrieved (Fig. 4c). The score of

the assignment (Assignment Score) was calculated based on rate of assigned ion among product ion spectrum. As a result of automatic assignment of product ion spectrum, eight candidates received a highest score (Fig. 4d). Finally, 218 candidates were narrowed to 6 candidates by the scoring based on formula prediction and automatic assignment (Fig. 4e).



Formula prediction

Rank	Score	Formula (M)	Ion	Meas. m/z	Pred. m/z	Diff (mDa)	Diff (ppm)	Iso Score	DBE
1	92.7	C22H18O10	[M+H] ⁺	443.0979	443.0973	0.6	1.35	93.52	14
2	92.56	C17H15N8O5P	[M+H] ⁺	443.0979	443.0976	0.3	0.68	92.56	15
3	91.72	C18H11N12O4P	[M+H] ⁺	443.0979	443.0989	-1	-2.26	94.7	20
4	91.34	C23H14N4O6	[M+H] ⁺	443.0979	443.0986	-0.7	-1.58	92.69	19
5	85.61	C15H20N6O6P2	[M+H] ⁺	443.0979	443.0992	-1.3	-2.93	89.95	10
6	83.74	C21H19N2O7P	[M+H] ⁺	443.0979	443.1003	-2.4	-5.42	97.6	14
7	80.59	C14H24N2O10P2	[M+H] ⁺	443.0979	443.0979	0	0	80.59	5
8	80.08	C19H10N10O4	[M+H] ⁺	443.0979	443.0959	2	4.51	87.78	20
9	78.41	C24H10N8O2	[M+H] ⁺	443.0979	443.0999	-2	-4.51	87.05	24
10	78.27	C16H19N4O9P	[M+H] ⁺	443.0979	443.0962	1.7	3.84	84.25	10
11	76.33	C16H16N10O2P2	[M+H] ⁺	443.0979	443.1006	-2.7	-6.09	96.5	15
12	68.7	C11H16N12O4P2	[M+H] ⁺	443.0979	443.0965	1.4	3.16	72.62	11
13	68.37	C16H14N10O4S	[M+H] ⁺	443.0979	443.0993	-1.4	-3.16	72.27	15
14	65.09	C15H18N6O8S	[M+H] ⁺	443.0979	443.098	-0.1	-0.23	65.09	10
15	63.58	C18H20N6O2P2S	[M+H] ⁺	443.0979	443.0967	1.2	2.71	66.42	14
16	58.21	C13H23N4O9P2S	[M+H] ⁺	443.0979	443.0996	-1.7	-3.84	62.66	5
17	57.32	C19H22O10S	[M+H] ⁺	443.0979	443.1006	-2.7	-6.09	72.46	9
18	55.79	C8H20N12O4P2S	[M+H] ⁺	443.0979	443.0999	-2	-4.51	61.16	6

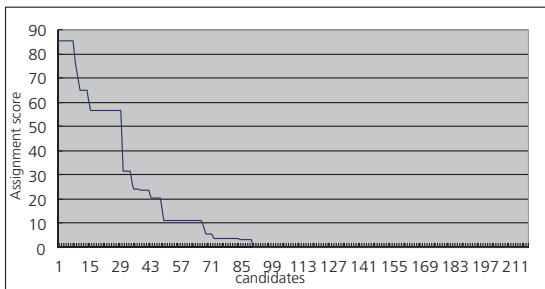
b) Predicted formulae and each Formula Scores of Var_337

Database searching

1	58567	C22H18O10	(2S,3S)-2-(3,4-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
2	97034	C22H18O10	(2R,3R)-2-(3,4-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
3	325907	C22H18O10	(-)-Epicatechingallate
4	338663	C16H19N4O9P	methyl (1-amino-2-phenylethyl)methylphosphinate - 2,4,6-trinitrophenol (1:1)
5	414024	C22H18O10	(2R,3S)-2-(3,4-dihydroxyphenyl)-3,5-dihydroxy-3,4-dihydro-2H-chromen-7-yl 3,4,5-trihydroxybenzoate
6	508505	C23H14N4O6	N-(3-[[[2R]-tetrahydrofuran-2-ylmethyl(aminol)oxy]oxy]oxy)-2-yl)-2,1,3-benzothiadiazole-4-sulfonamide
7	1294545	C19H19N6O3S2	N-(3-[[[2R]-tetrahydrofuran-2-ylmethyl(aminol)oxy]oxy]oxy)-2-yl)-2,1,3-benzothiadiazole-4-sulfonamide
8	1294546	C19H19N6O3S2	N-(3-[[[2S]-tetrahydrofuran-2-ylmethyl(aminol)oxy]oxy]oxy)-2-yl)-2,1,3-benzothiadiazole-4-sulfonamide
9	1317425	C19H19N6O3S2	ethyl 2-[[[3-amino-5-[[[cyanomethyl(sulfanyl)(-H)H]-2,4-triazol-4-yl]acetyl(aminol)-5-phenylthio]phenyl]-3-carboxylate
10	1956909	C19H19N6O3S2	2-[[[5-oxo-4-propyl-4,5-dihydro[1,2,4]triazol[3,4-b]iazol[5,3-a]iazolo[1-h]tetrazolo[5,1-b]sulfanyl]acetyl(aminol)thio]phenyl]-3-carboxamide
11	1622535	C19H19N6O3S2	acetamide, 2-[[[5-cyano-1,6-dihydro-4-(3-methoxyphenyl)-6-oxo-2-pyrimidinylthio]-N-(5-propyl-1,3,4-thiadiazol-2-yl)-6-acetyl-2-[[[1-(2-methoxy-5-methylphenyl)-1H-tetrazolo[5,1-b]sulfanyl(methyl)-5-methylthio]no[2,3-d]pyrimidin-4(3H)-one
12	1844201	C19H19N6O3S2	2-[[[5-oxo-4-propyl-4,5-dihydro[1,2,4]triazol[3,4-b]iazol[5,3-a]iazolo[1-h]tetrazolo[5,1-b]sulfanyl]acetyl(aminol)thio]phenyl]-3-carboxamide
13	1856913	C19H19N6O3S2	2-[[[5-oxo-4-propyl-4,5-dihydro[1,2,4]triazol[3,4-b]iazol[5,3-a]iazolo[1-h]tetrazolo[5,1-b]sulfanyl]acetyl(aminol)thio]phenyl]-3-carboxamide
14	1888120	C23H14N4O6	4-[[[4-methylsulfanyl]benzyl]-5-[[[5,5-dimethylphenyl]sulfanyl]oxy]oxy]benzoate
15	1906121	C19H19N6O3S2	ethyl 5-methyl-2-[[[4-methyl-5-pyridin-4-yl]-4H-1,2,4-triazol-3-yl]sulfanyl(methyl)-4-oxo-3,4-dihydrothieno[2,3-d]pyrimidin-4-yl]oxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
16	2028976	C22H18O10	tetramethyl 9,10-dihydroanthracene-2,3,6,7-tetracarboxylate
17	2174189	C18H22N2O7S2	1-[[4-methoxyphenyl]sulfanyl]2-[[4-(thio)phen-3-ylmethyl]acetate ethanediolate
18	2184200	C19H19N6O3S2	5-thiazolecarboxylic acid, 4-methyl-2-[[[5-[[methyl-5H-1,2,4-triazolo[5,6-b]indol-3-yl]thio]acetyl(aminol)-ethyl ester
19	2350799	C19H19N6O3S2	N-[[4-[[4,6-dimethylpyrimidin-2-yl]sulfanyl]oxy]phenyl]carbamothioyl]pyrimidine-3-carboxamide
20	2383144	C19H19N6O3S2	acetamide, N-[[4-[[aminosulfanyl]phenyl]-2-[[5-ethyl-5H-1,2,4-triazolo[5,6-b]indol-3-yl]thio]-N-(6-ethoxy-1,3-benzothiazol-2-yl)-2-[[1-(4-methoxyphenyl)-1H-tetrazolo[5,1-b]sulfanyl]acetyl(aminol)thio]phenyl]-3-carboxamide
21	2401754	C19H19N6O3S2	N-(6-ethoxy-1,3-benzothiazol-2-yl)-2-[[1-(4-methoxyphenyl)-1H-tetrazolo[5,1-b]sulfanyl]acetyl(aminol)thio]phenyl]-3-carboxamide
22	2416220	C19H19N6O3S2	2-[[[4-allyl-5-(7-methoxy-1-benzofuran-2-yl)-4H-1,2,4-triazol-3-yl]sulfanyl]-N-(5-methyl-1,3,4-thiadiazol-2-yl)acetamide
23	2437746	C19H19N6O3S2	N-(4-phenyl-1,3-thiazol-2-yl)-2-[[[1,3,7-trimethyl-2,6-dioxo-2,3,6,7-tetrahydro-1H-purin-8-yl]sulfanyl]acetamide

c) Database searching result for Var_337

Automatic assignment



Scoring based on formula prediction and assignment

ID	Assigned Score	Formula Score	Final Score	Formula	Common Name
58567	85.6	94.53	89.95	C22H18O10	(2S,3S)-2-(3,4-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
97034	85.6	94.53	89.95	C22H18O10	(2R,3R)-2-(3,4-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
325907	85.6	94.53	89.95	C22H18O10	(-)-Epicatechingallate
4440417	85.6	94.53	89.95	C22H18O10	Benzoic acid, 3,4,5-trihydroxy-, (2R,3S)-2-(3,4-dihydroxyphenyl)-3,4-dihydro-5,7-dihydroxy-2H-1-benzopyran-3-yl ester
4925466	85.6	94.53	89.95	C22H18O10	(2S,3R)-2-(3,4-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
9434303	85.6	94.53	89.95	C22H18O10	(2R,3R)-2-(3,5-dihydroxyphenyl)-5,7-dihydroxy-3,4-dihydro-2H-chromen-3-yl 3,4,5-trihydroxybenzoate
338663	85.6	78.26	81.85	C16H19N4O9P	methyl (1-amino-2-phenylethyl)methylphosphinate - 2,4,6-trinitrophenol (1:1)
4958048	85.6	52.89	67.29	C18H22N2O7S2	2,5-diethoxy-4-[[4-(methylphenyl)sulfanyl]benzenediazonium hydrogen sulfate - formaldehyde (1:1)

Fig. 4 Compound identification result for Var_337

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Table 2 Candidates representing the 20 components that most impact tea quality as determined by VIP value

ID	<i>m/z</i>	R.T. (min)	Candidate	Formula	Ion	Final Score
UK -001	195.087	4.807	caffeine	C ₈ H ₁₀ N ₄ O ₂	[M+H] ⁺	94.24
UK -002	307.080	4.063	galocatechin	C ₁₅ H ₁₄ O ₇	[M+H] ⁺	87.86
UK -003	459.092	5.156	galocatechin gallate	C ₂₂ H ₁₈ O ₁₁	[M+H] ⁺	93.07
UK -004	443.097	6.392	catechin gallate	C ₂₂ H ₁₈ O ₁₀	[M+H] ⁺	89.95
UK -005	261.169	5.429	1-(4-amino-6,7,8,9-tetrahydro-1h-imidazo[4,5-c]quinolin-1-yl)-2-methylpropan-2-ol	C ₁₄ H ₂₀ N ₄ O	[M+H] ⁺	73.06
UK -006	345.080	1.003	theogalline	C ₁₄ H ₁₆ O ₁₀	[M+H] ⁺	93.84
UK -007	339.106	5.719	coumaroyl quinic acid	C ₁₆ H ₁₈ O ₈	[M+H] ⁺	82.14
UK -008	217.068	4.805	(Sodium ion adduct of UK-001)			
UK -009	261.169	4.034	1-(4-amino-6,7,8,9-tetrahydro-1h-imidazo[4,5-c]quinolin-1-yl)-2-methylpropan-2-ol	C ₁₄ H ₂₀ N ₄ O	[M+H] ⁺	75.44
UK -010	361.088	5.717	(Sodium ion adduct of UK-007)			
UK -011	273.074	6.393	(Fragment of UK -004)			
UK -012	365.159	4.4	ethyl-5-(acetylamino)-2,3,4,5-tetra-deoxy-2-methylidene-4-nitro-d-glycero-d-galacto-nononate	C ₁₄ H ₂₄ N ₂ O ₉	[M+H] ⁺	58.90
UK -013	291.086	3.958	catechin	C ₁₅ H ₁₄ O ₆	[M+H] ⁺	93.65
UK -014	417.172	6.971	3-[[4-(2,4-dimethylphenyl)-5-(1-naphthylmethyl)-1,2,4-triazol-3-yl]sulfanyl]propanamide	C ₂₄ H ₂₄ N ₄ OS	[M+H] ⁺	59.30
UK -015	275.185	5.841	[4-amino-1-(2-methylpropyl)-6,7,8,9-tetrahydro-1h-imidazo[4,5-c]quinolin-2-yl]methanol	C ₁₅ H ₂₂ N ₄ O	[M+H] ⁺	76.53
UK -016	181.072	2.541	4-hydroxy-6-methyl-3,4-dihydropteridin-2(1H)-one	C ₇ H ₈ N ₄ O ₂	[M+H] ⁺	86.80
UK -017	471.090	8.433	Luteolin 7-b-D-Glucopyranoside	C ₂₁ H ₂₀ O ₁₁	[M+Na] ⁺	84.23
UK -018	565.157	7.027	3,4-dihydroxy-9,10-dioxo-9,10-dihydroanthracen-2-yl-6-O-(6-deoxy-alpha-L-mannopyranosyl)-beta-D-glucopyranoside	C ₂₆ H ₂₈ O ₁₄	[M+H] ⁺	53.25
UK -019	579.150	4.123	(2r,3s)-2-(3,4-dihydroxyphenyl)-8-(2,3-dihydroxy-5-[(2r,3s)-3,5,7-trihydroxy-3,4-dihydro-2h-chromen-2-yl]phenyl)-3,4-dihydro-2h-chromene-3,5,7-triol	C ₃₀ H ₂₆ O ₁₂	[M+H] ⁺	64.55
UK -020	307.083	1.834	galocatechin	C ₁₅ H ₁₄ O ₇	[M+H] ⁺	87.86

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4. Conclusions

The LCMS-IT-TOF provides positive and negative MS^n data with low variability. In this study, MS^1 data was used to generate a spectrally aligned data array of mass intensity and retention time pairs for multivariate analysis. A PLS regression was performed using this peak set and a tea quality contest ranking as the free and bound variables, respectively. The quality evaluation model was constructed successfully using a PLS regression model. Whole samples except test samples which ranked 10th, 20th and 30th places were used as the training set. We selected 20 features for compound identification which the quality prediction model indicated high importance. Thousands of candidates

were initially returned by the database search. By using an automatic workflow involving formula prediction and product ion assignment, the number of candidates were narrowed successfully without non-trivial tasks such as the manual assignment of the product ion spectrum and literature searching. In addition to well-known compounds such as caffeine and catechins, these candidates include various esters of organic acids. This technique is not limited to the analysis of secondary metabolites as reported here, but is also applicable for the prediction of a wide range of compounds, including additives and impurities in polymers and pesticides.