

3rd International Electronic Conference on Metabolomics

15-30 November 2018 chaired by Prof. Peter Meikle, Dr. Thusitha W. Rupasinghe, Prof. Susan Sumner, Dr. Katja Dettmer-Wilde



WebSpecmine:

A website for metabolomics data analysis and mining

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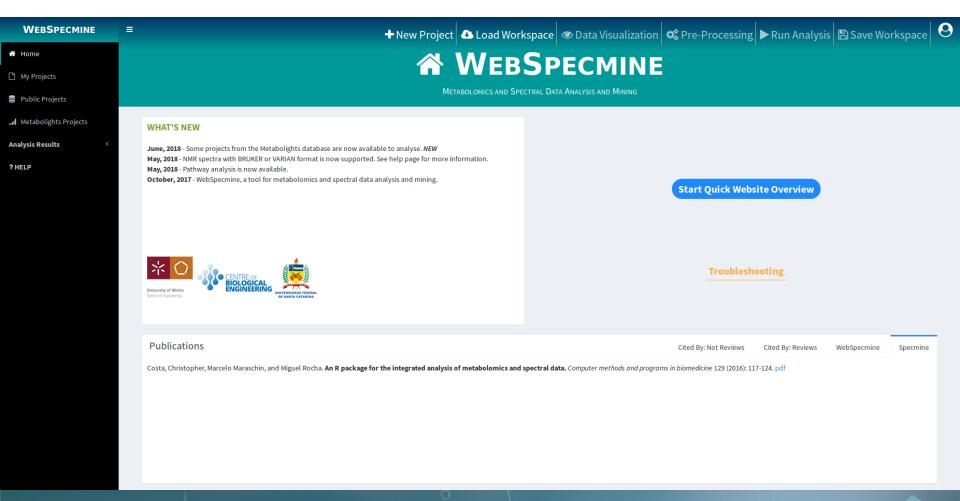
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- ² Plant Morphogenesis and Biochemistry Laboratory, Federal University of Santa Catarina, Florianpolis, SC, Brazil.
- * Corresponding authors: saracardoso501@gmail.com; mrocha@di.uminho.pt





WebSpecmine:

A website for metabolomics data analysis and mining









Introduction

Metabolomics

✓ Analysing metabolomics data correctly and efficiently is nowadays very important in biological and biomedical research.

However

Most people that want to perform this analysis may not have the programming skills needed

A website to perform metabolomics data analysis is an important asset







Introduction

Some of the Existing Websites

	Covered Techniques	Univariate Analysis	Multivariate Analysis	Other Features
4.0	LC/GC-MS Raw Spectra LC/GC-MS Peak Lists NMR Peak Lists Metabolites' Concentrations (Quantitative Data)	T-Test; ANOVA; Fold Change	PCA; Clustering; Machine Learning (only PLS-DA); Feature Selection (only Random Forests and SVM)	Correlation Analysis; Metabolite Identification (only for MS); Pathway Analysis
XCMS	LC/GC-MS Raw Spectra	T-Test; ANOVA; Non-Parametric Tests;	PCA; Clustering; Machine Learning (only LDA, PLS-DA and Random Forests)	Metabolite Identification; Pathway Analysis; User Account







Introduction

A wide variety of techniques and Spectral Data (Raman, UV-Vis and IR) is missing data formats supported A wide variety of pre-processing Mostly just normalization, scaling, missing values methods treatment A wide variety of analysis There should be more model options for machine learning, for example methods Most of the time, users have to follow a strict Flexible Pipeline pipeline So that data and results can be stored and shared **User Account**



What is missing in the existing websites?



What was our main goal, then?

✓ Create an easy-to-use and freely available website that provides a wide variety of methods and data types for analysis, and ways to store and share metabolomics data and the results generated.

SOLUTION:







WebSpecmine: overview



Metabolomics data Supported

- ✓ NMR
- ✓ LC/GC-MS
- ✓ Infrared, UV-Visible, and Raman Spectra
- ✓ Concentrations Data (Quantitative Data)



User Account

- ✓ Store data and results privately
- ✓ Share data across users



Data Pre-Processing



Tutorials and User Guide

Metabolomics data Analysis Available

- ✓ Univariate Statistical Analysis
- ✓ Unsupervised Multivariate Statistical Analysis
- ✓ Supervised Multivariate Statistical Analysis
- ✓ Metabolite Identification
- ✓ Pathway Analysis





LC/GC-MS

Raw Spectra Data Formats

- ✓ .mzData
- ✓ .mzXML
- ✓ .netDF

Peak Lists Data Formats

- ✓ CSV
- ✓ TSV



NMR

Raw Spectra Data Formats

- ✓ BRUKER
- ✓ VARIAN

Peak Lists Data Formats

- ✓ CSV
- ✓ TSV

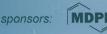


Spectral Data: Raman, IR and UV-Vis

Spectra Data Formats

- ✓ CSV
- ✓ (J)DX
- ✓ SPC
- ✓ MS EXCEL (.xlsx)







Concentrations (Quantitative) Data

Metabolites Names or Identifiers

✓ CSV/TSV File:

6-Anhydro-beta-D-glucose, 1-Methylnicotinamide, 2-Aminobutyrate, 2-Hydroxyisobutyrate, 2-Oxoglutarate

,65.37,18.73,26.05,71.52 PIF 087, 18,340.36,24.29,41.68,67.36 .43,64.72,12.18,65.37,23.81 NETL 005 V1,154.47,52.98,172.43,74.44,1199.91 PIF 115, ,73.7,15.64,83.93,33.12

Samples' Names

Concentrations values of each metabolite in each sample







Metadata

- ✓ All types of data should have a metadata file associated
- ✓ CSV/TSV File:

```
Names of the metadata classes
```

```
PIF_178 cachexic
PIF_087 cachexic
PIF_090 cachexic
NETL_00 V1, cachexic
PIF 115 cachexic
Samples' Metadata values for each
Netadata class in each sample
Names
```



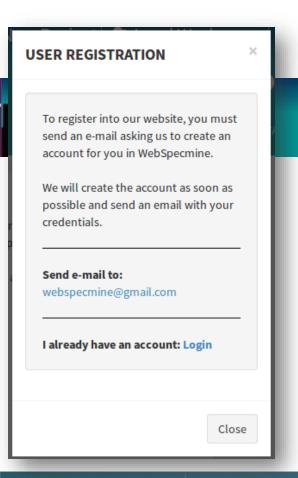


Why a User Account?

- ✓ Main website functionalities are accessible without a user account
- ✓ But you will have to create an account if you want to:
 - Save and Share data and results
 - Leave an analysis in 'stand-by'







Creation of a User Account



To have one, users have to send an email, asking to create an account, and an email with the credentials will be sent as soon as possible.

Email: webspecmine@gmail.com



Data Projects: What is?

A project is a study, or group of studies, which contains the data and metadata for each study, as well as reports from the results obtained

Projects can be:

Private public

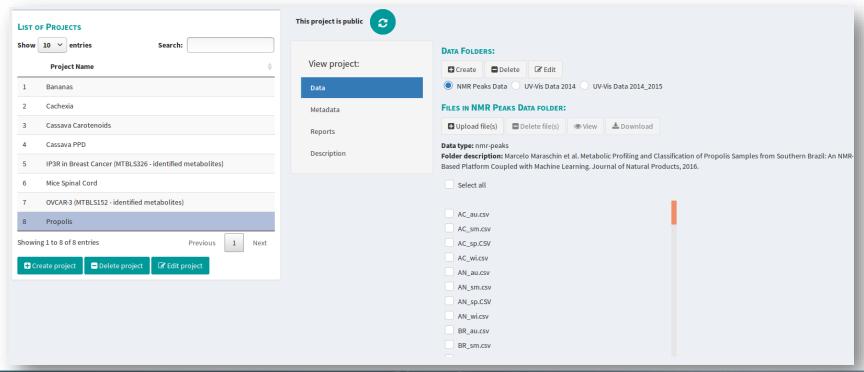






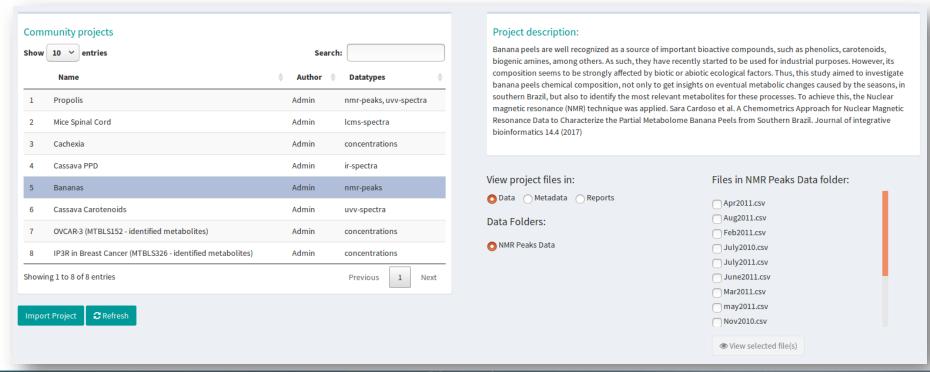
Your Projects

The projects stored in an account are accessible through *My Projects* sidebar tab



Public Projects

Everyone that accesses the website can see all public projects, at the *Public Projects* sidebar tab



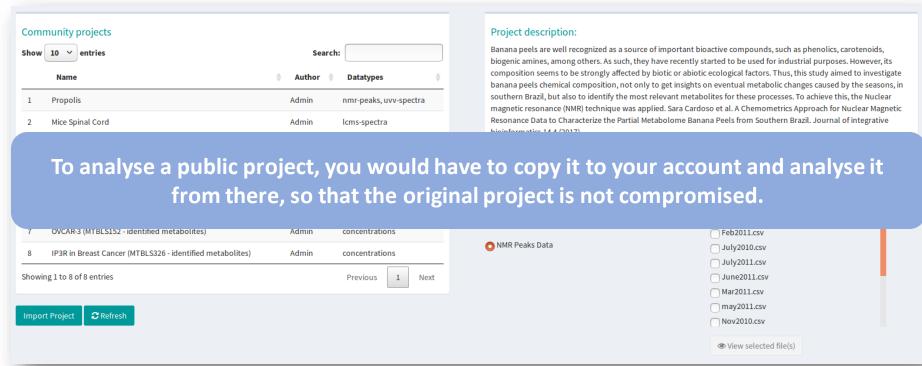






Public Projects

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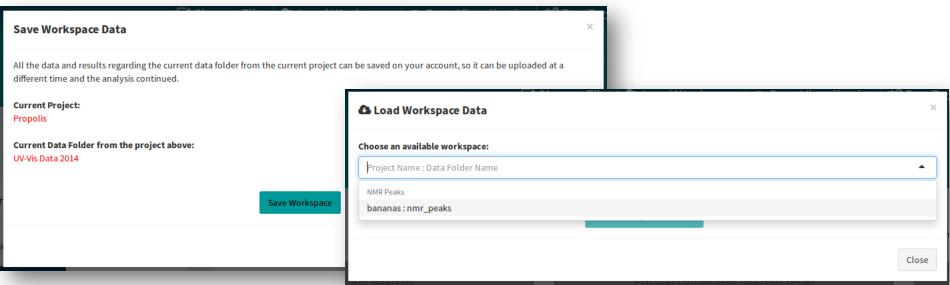


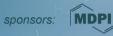




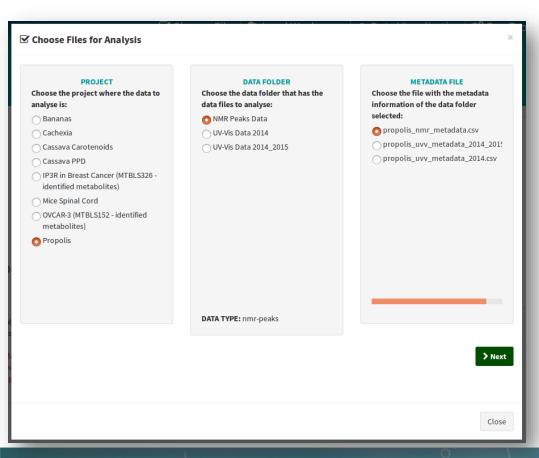
Workspace: Users can leave their analysis in 'stand-by' and continue later

Users can leave an analysis at any time, by saving the workspace, and continue next time







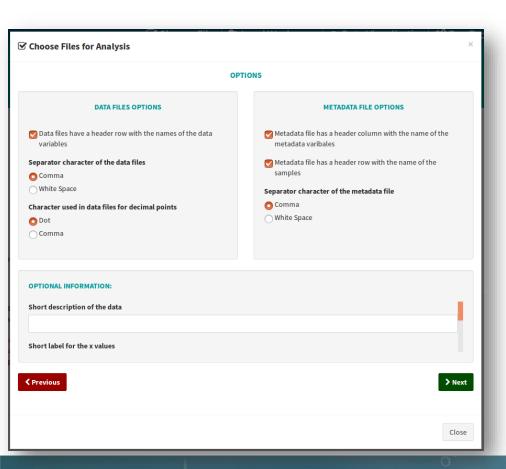


For Logged In Users

Select the Project, the data folder from that project where the data to analyse is, and the metadata file from that project that corresponds to the data selected



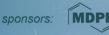




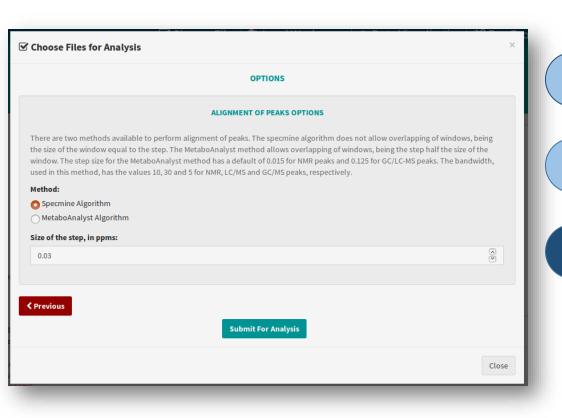
For Logged In Users

Set the options required to correctly read the data and metadata files







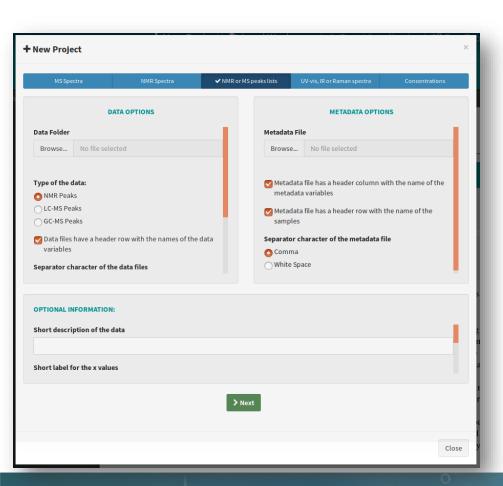


For Logged In Users

2

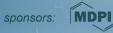
After finishing the setting of data and metadata options, the user can submit the data for analysis





For Logged Out Users

- ✓ The Procedure is similar, but the data files and metadata files have to be submitted, as they are not stored in the website.
- ✓ The data submitted will only be temporarily stored, while the analysis is in action.





Once the user selects the data, the data analysis pages will be accessible

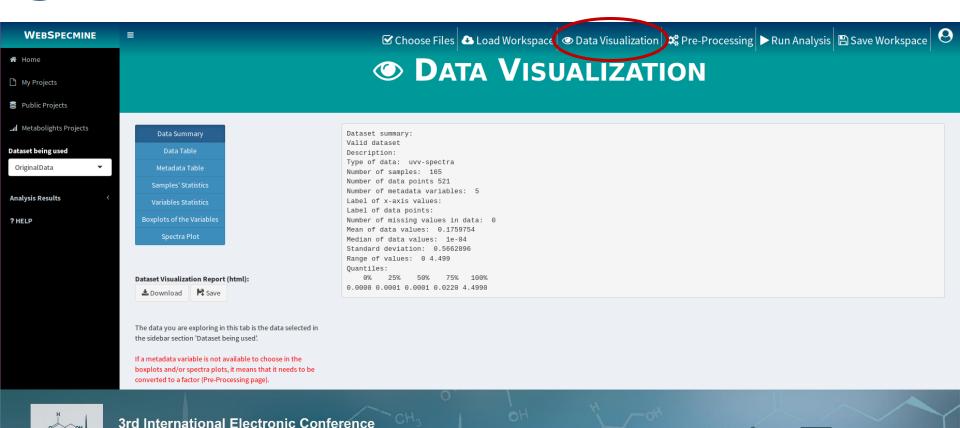




1

on Metabolomics 15-30 November 2018

The website provides a way to visualize the data



Data Summary

Data Summary Data Table Samples' Statistics

Dataset Visualization Report (html):

The data you are exploring in this tab is the data selected in the sidebar section 'Dataset being used'.

If a metadata variable is not available to choose in the boxplots and/or spectra plots, it means that it needs to be converted to a factor (Pre-Processing page).

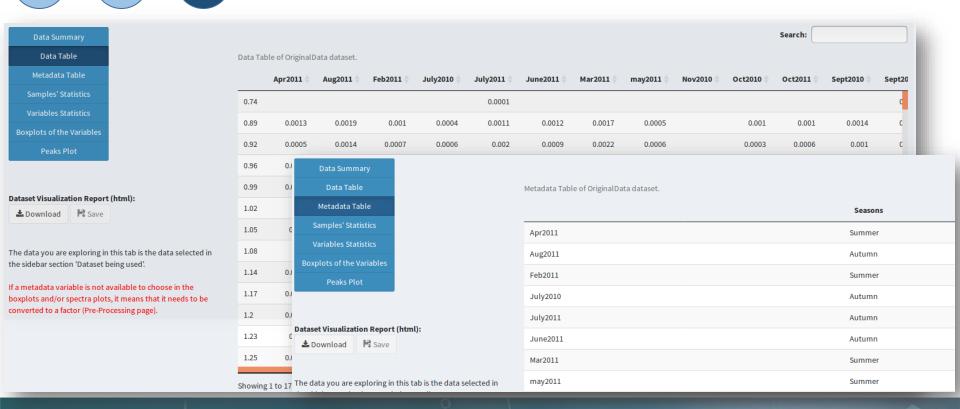
Dataset summary: Valid dataset Description: Type of data: nmr-peaks Number of samples: 13 Number of data points 173 Number of metadata variables: 1 Label of x-axis values: ppm Label of data points: Intensity Number of missing values in data: 795 Mean of data values: 0.02179374 Median of data values: 0.0019 Standard deviation: 0.04556014 Range of values: 1e-04 0.3023 Quantiles: 25% 50% 75%

0.000100 0.000700 0.001900 0.010875 0.302300



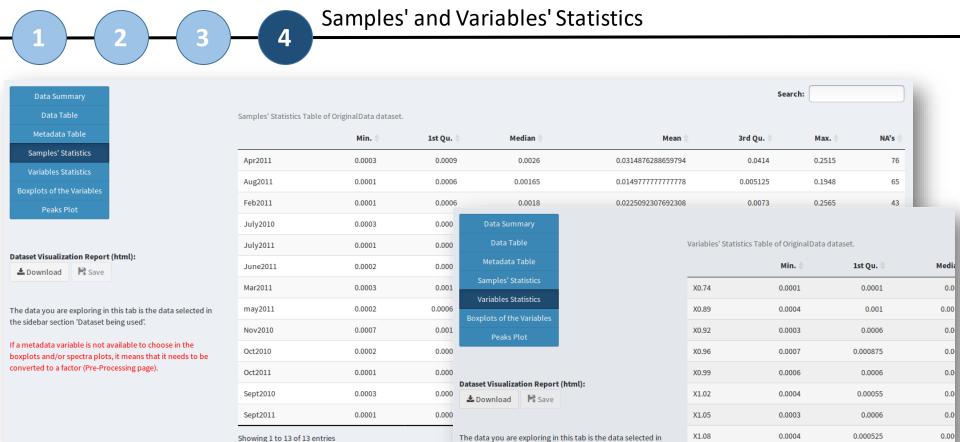
1 2 3

Data and Metadata Tables

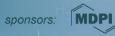




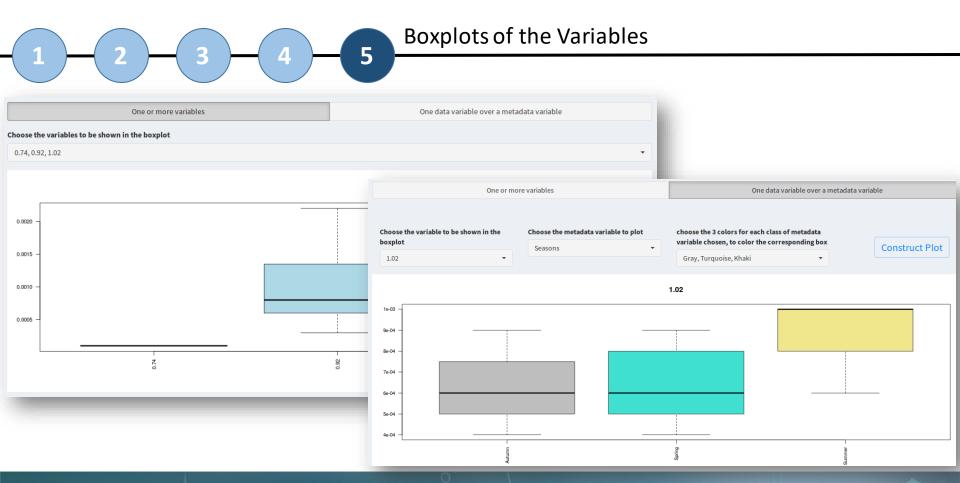








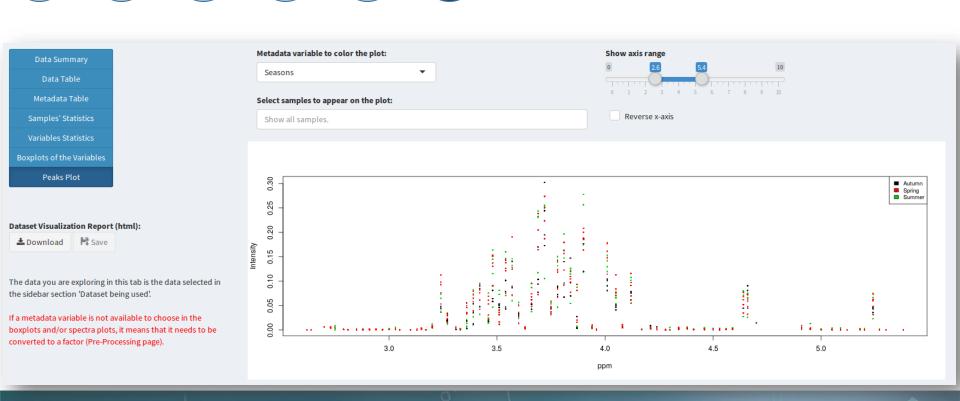








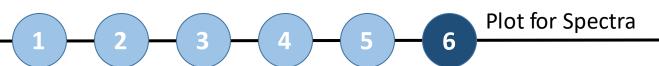


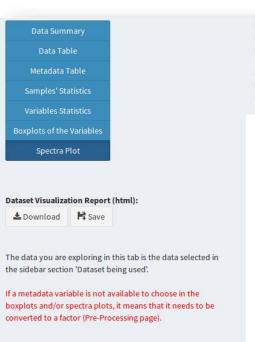


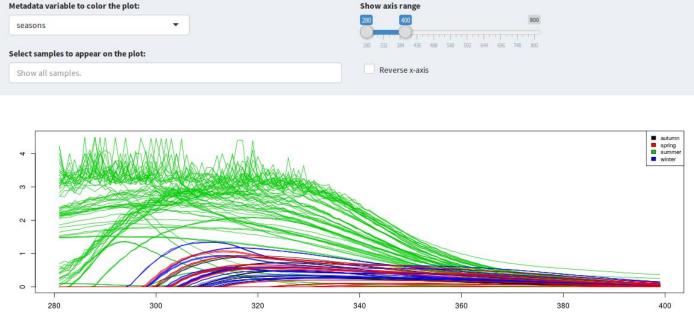










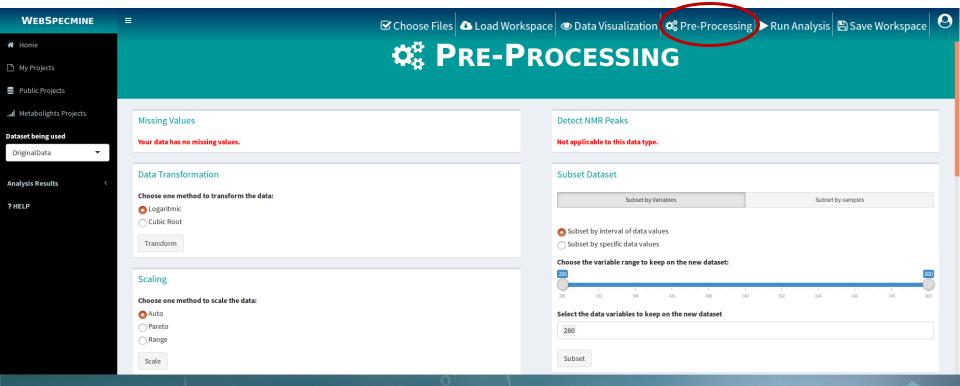








The website provides a wide variety of pre-processing methods, that can be performed in the desired order

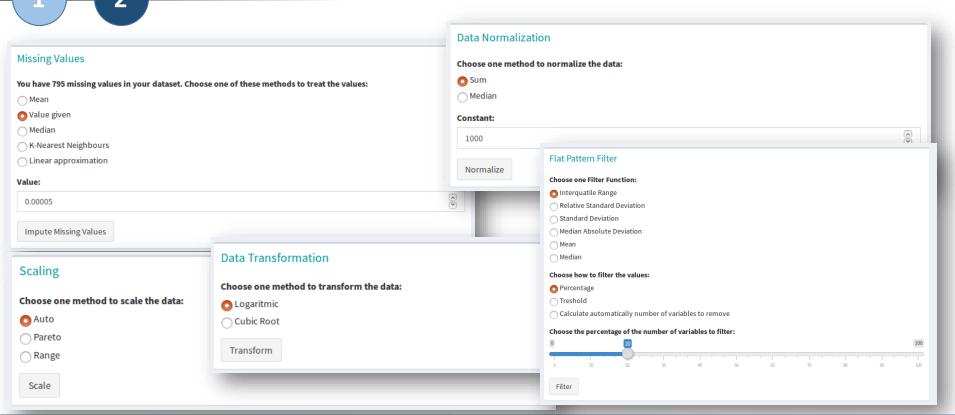








Methods that are available for all types of data

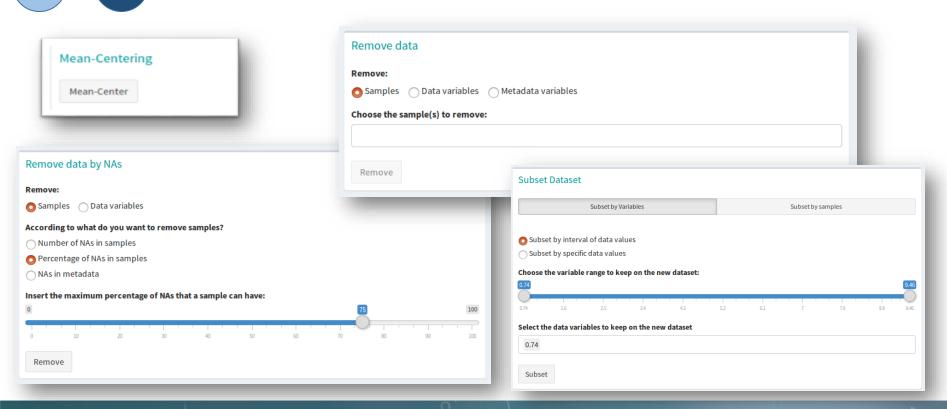






1 _ 2

Methods that are available for all types of data



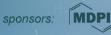




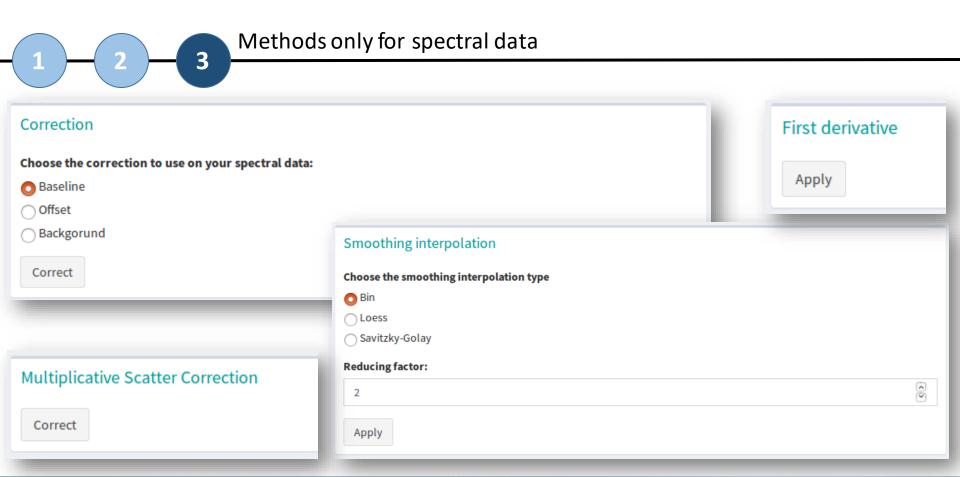
1 ___ 2

Methods that are available for all types of data

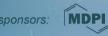
Aggregate samples			
Samples can be aggregated according to the classes of a certain metadata variable. Samples in the same class will be aggregated together.			
Choose the metadata variable by which samples will be aggregated:			
Seasons •	Low-level data fusion		
Aggregate samples' values by:	Only the samples from the new data provided that have the same name as samples in the current dataset will be joined.		
O Mean	✓ M5 Spectra NMR Spectra NMR or M5 peaks lists UV-vis, IR or Raman spectra Concentrations		
Metadata variables to remove when aggregating the samples, if wanted. If not wanted, do not select any option:	Note that only the formats .mzXML, .netCDF, mzData are supported.		
No metadata variables will be removed	When reading the data, the peak detection will be performed.		
Aggregate	Data Folder		
	Browse No file selected		
	Type of the data:		
	○ LC-MS Spectra		
	Options for the feature (peak) detection in the chromatographic time domain:		
	Join With Current Dataset		







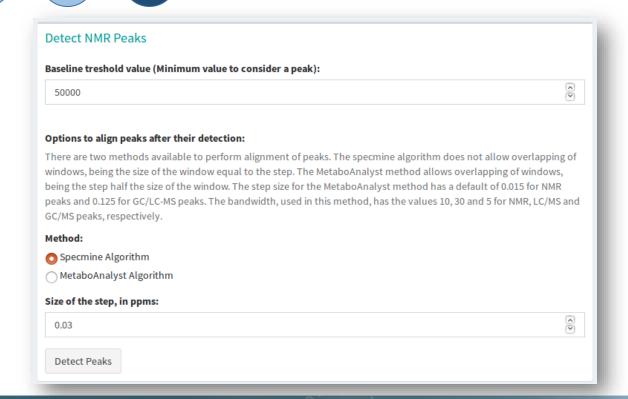






WebSpecmine: Pre-Processing



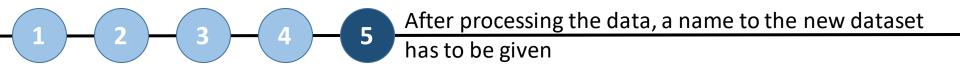








WebSpecmine: Pre-Processing

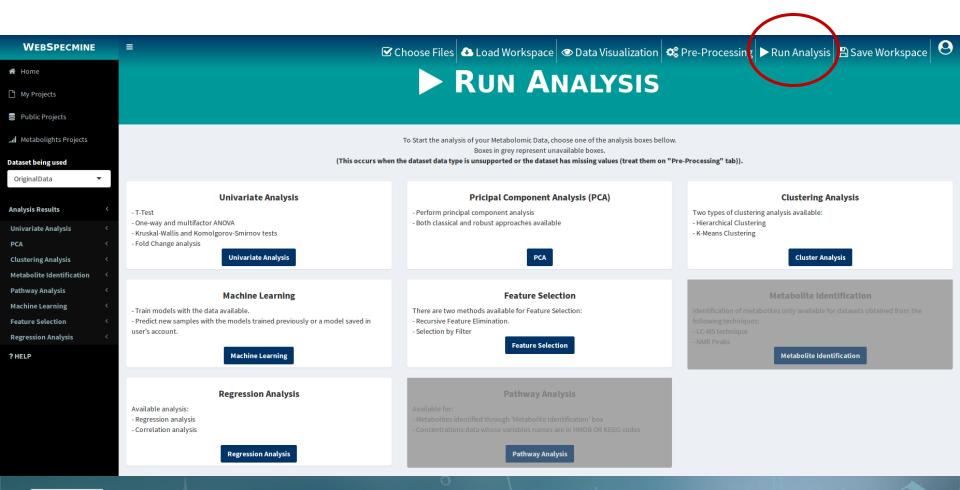


Name for the new dataset		
Write the name you would like to give	to the processed dataset, without spaces.	
	Finish	

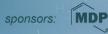
i To perform an analysis on the new dataset, the user will have to choose it on the sidebar panel







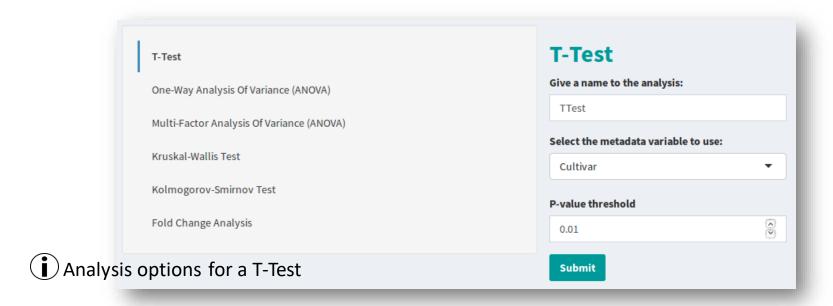






Univariate Analysis

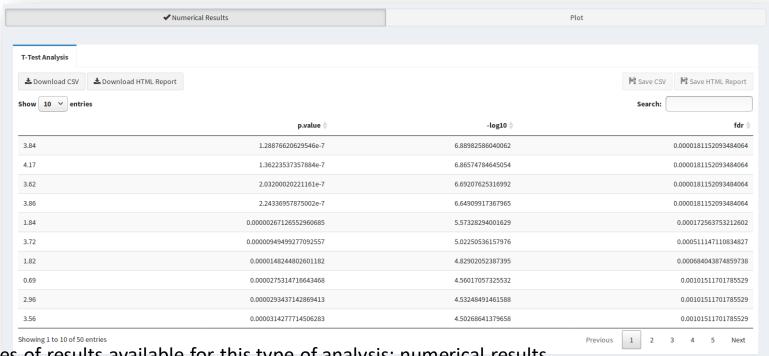
Example for T-Test





Univariate Analysis

Example for T-Test



i Types of results available for this type of analysis: numerical results

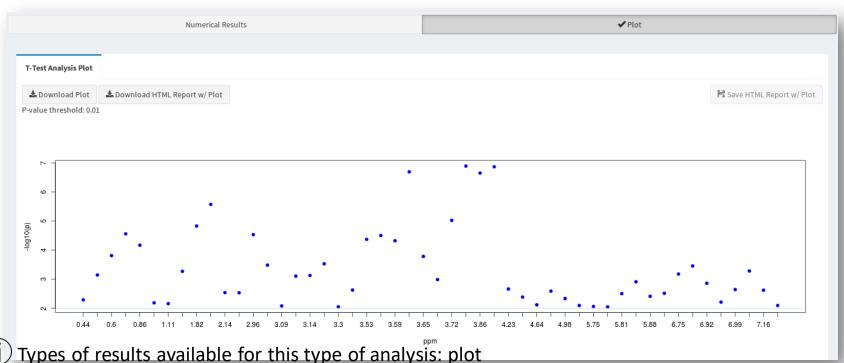


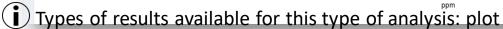




Univariate Analysis

Example for T-Test











Univariate Analysis

Other Analysis

T-Test

One-Way Analysis Of Variance (ANOVA)

Multi-Factor Analysis Of Variance (ANOVA)

Kruskal-Wallis Test

Kolmogorov-Smirnov Test

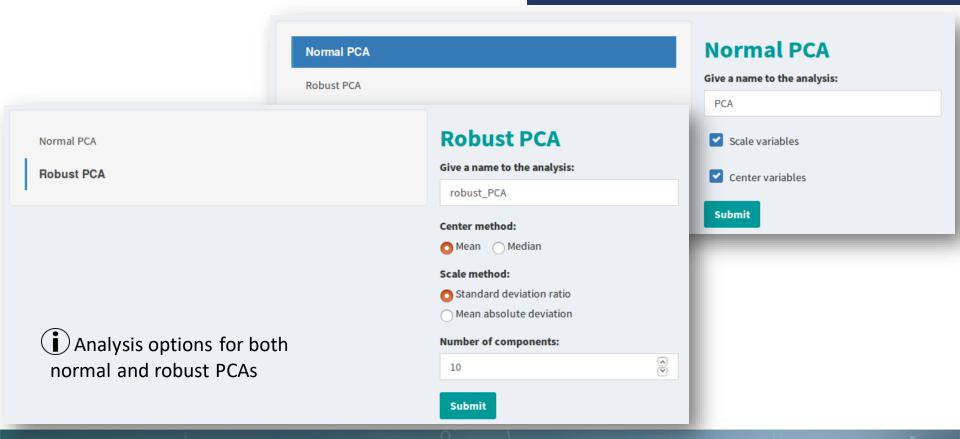
Fold Change Analysis

i There are other Univariate Analysis methods available

The types of results available for each analysis is similar to those showed for T-Test



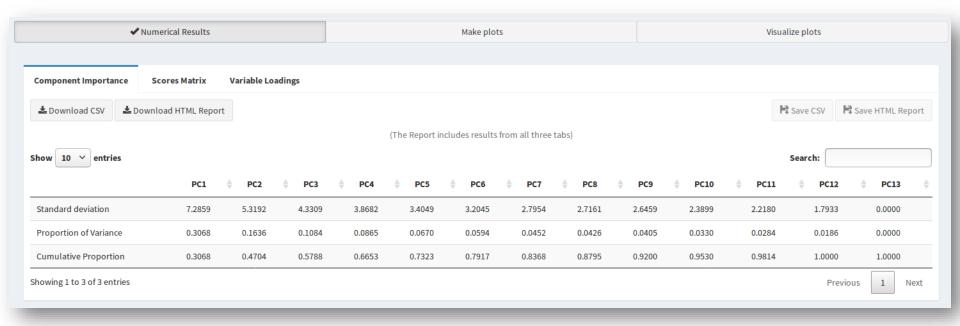
Principal Components Analysis (PCA)





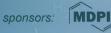


Principal Components Analysis (PCA)



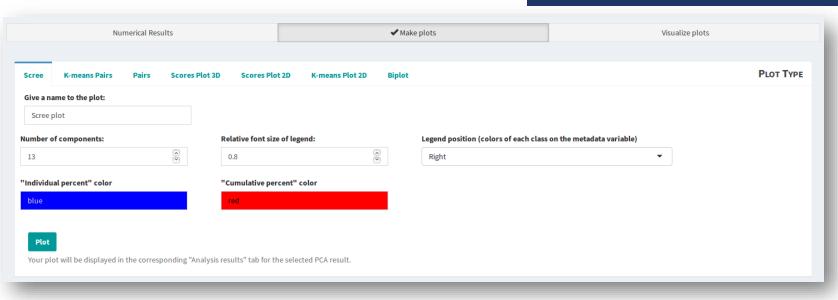
Types of results available for this type of analysis: numerical results







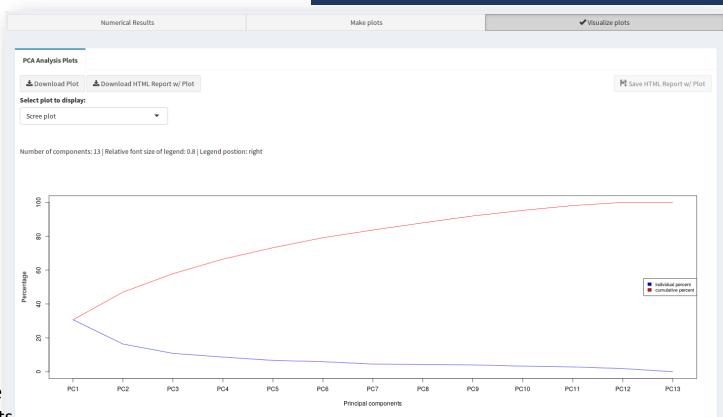
Principal Components Analysis (PCA)



Types of results available for this type of analysis: plot results



Principal Components Analysis (PCA)



i Types of results available for this type of analysis: plot results

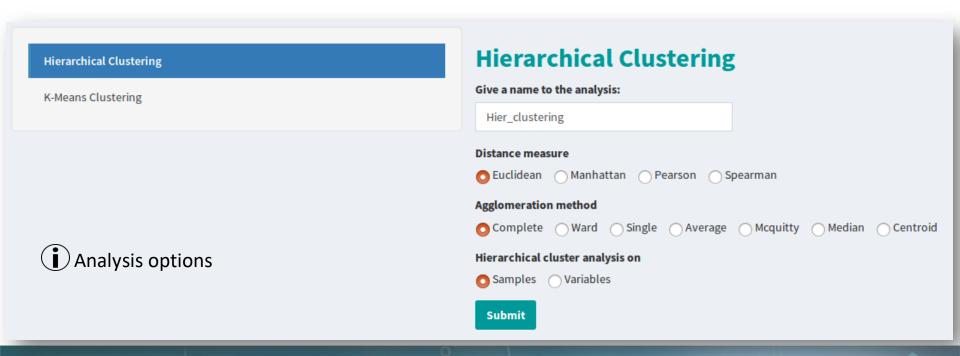






Clustering Analysis

Hierarchical Clustering



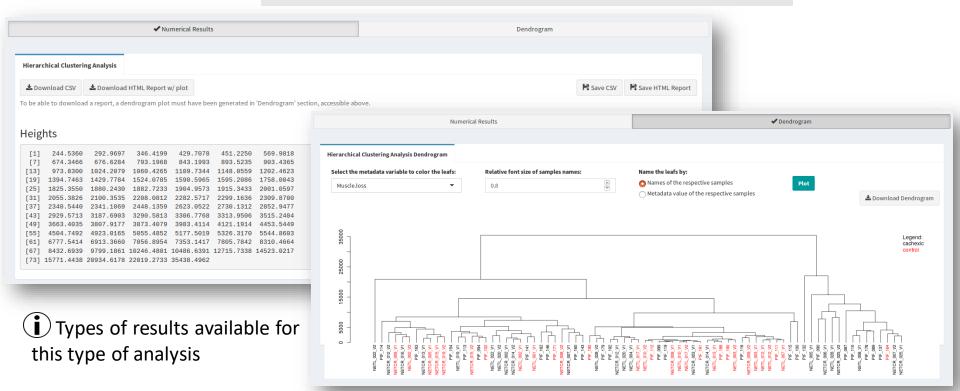


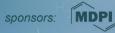




Clustering Analysis

Hierarchical Clustering

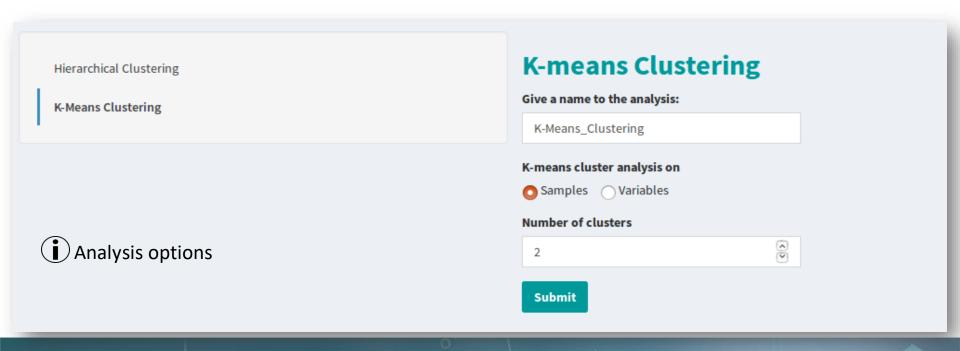






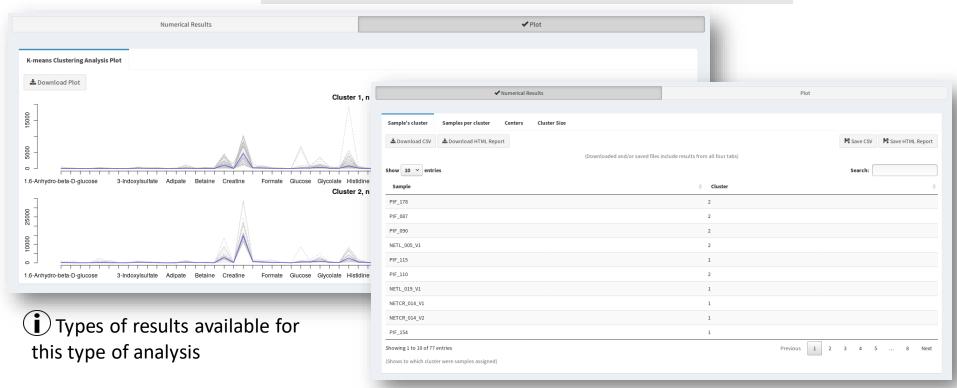
Clustering Analysis

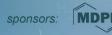
K-Means Clustering



Clustering Analysis

K-Means Clustering

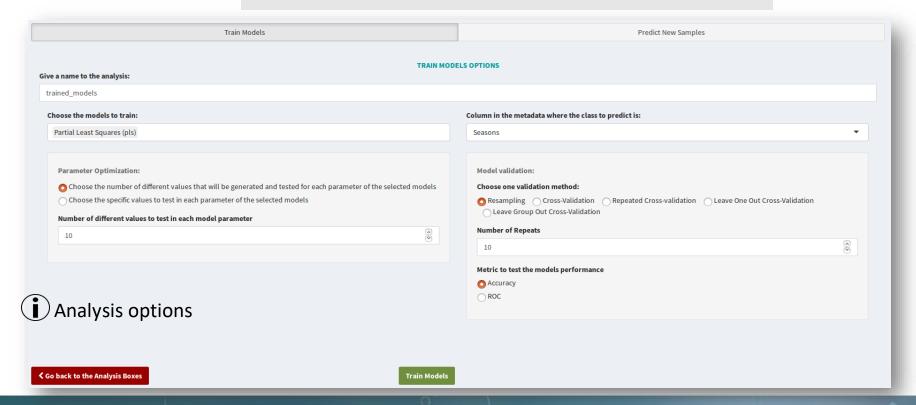






Machine Learning

Train Models

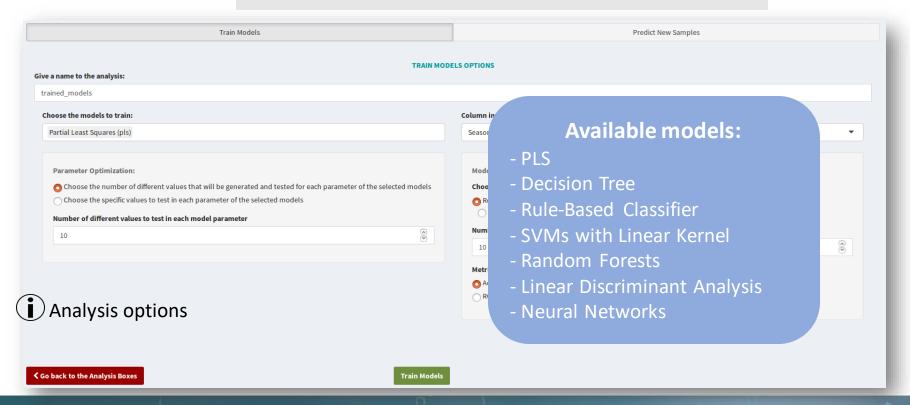


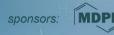




Machine Learning

Train Models

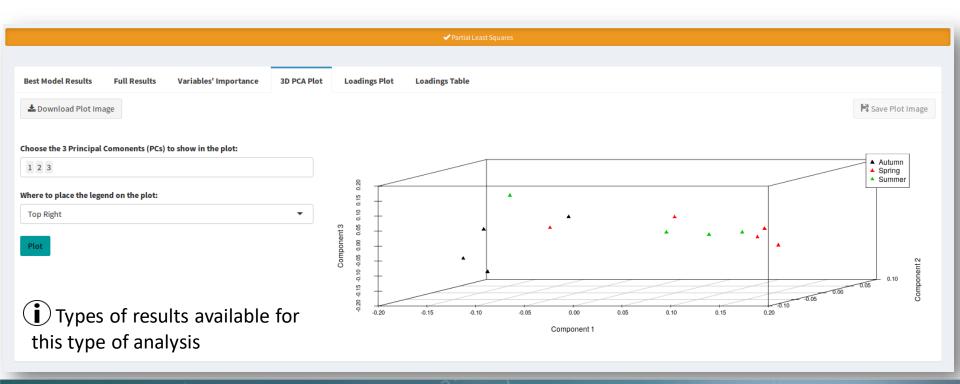


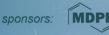




Machine Learning

Train Models

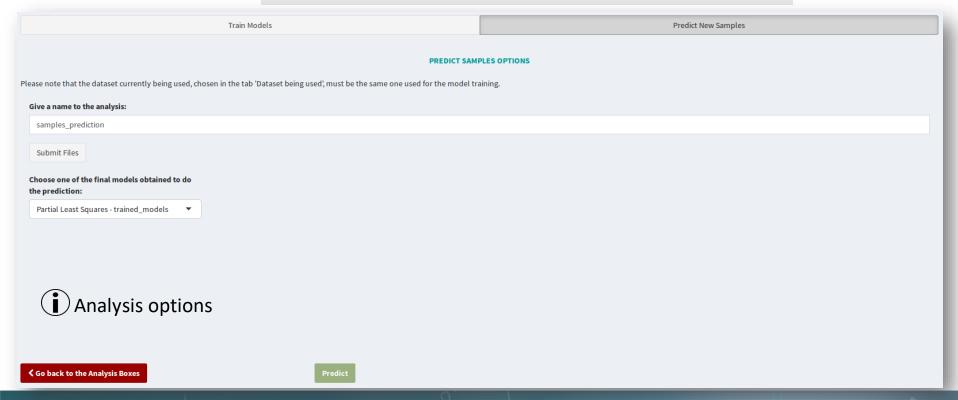






Machine Learning

Predict New Samples









Machine Learning

Predict New Samples

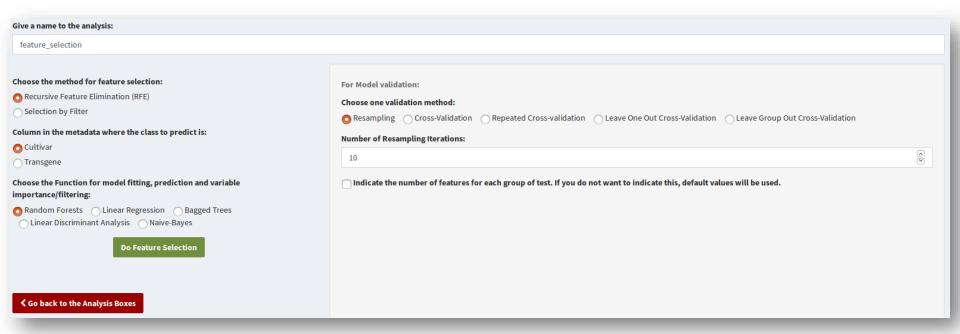






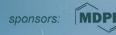


Feature Selection



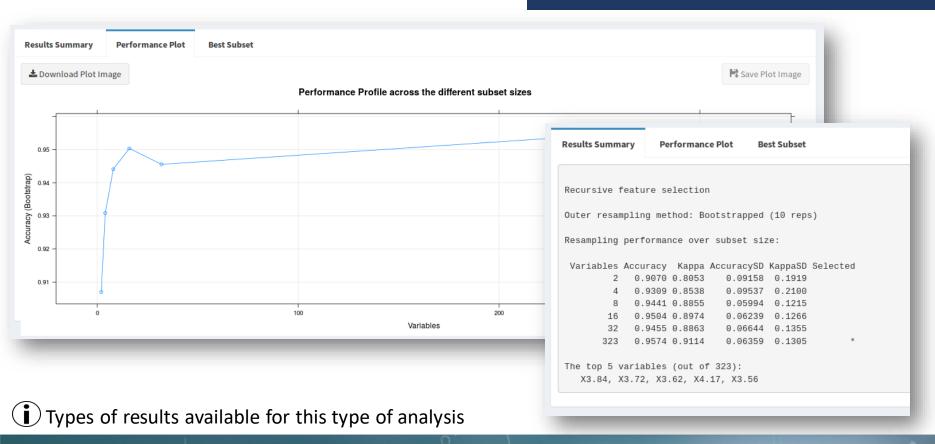


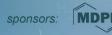






Feature Selection

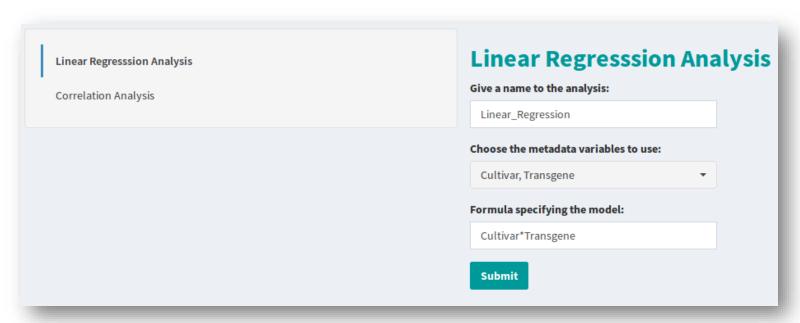






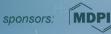
Regression Analysis

Regression Analysis



i Analysis options

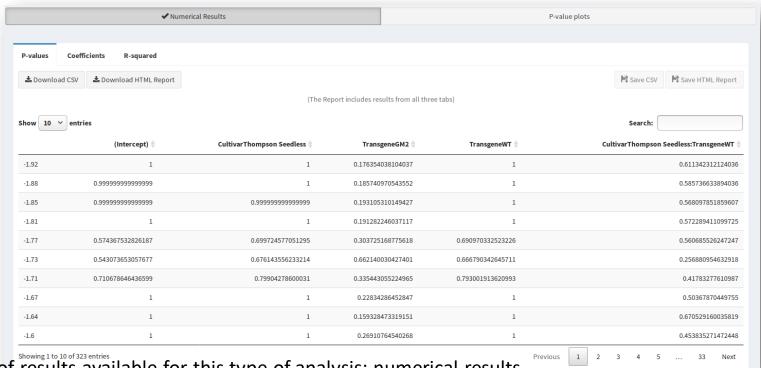






Regression Analysis

Regression Analysis



Types of results available for this type of analysis: numerical results

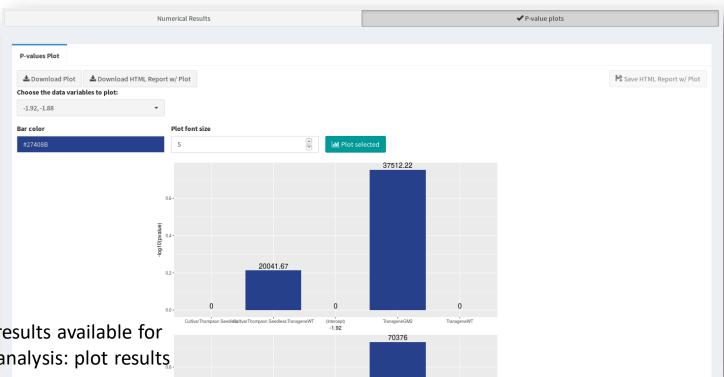


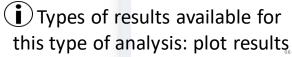




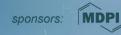
Regression Analysis

Regression Analysis



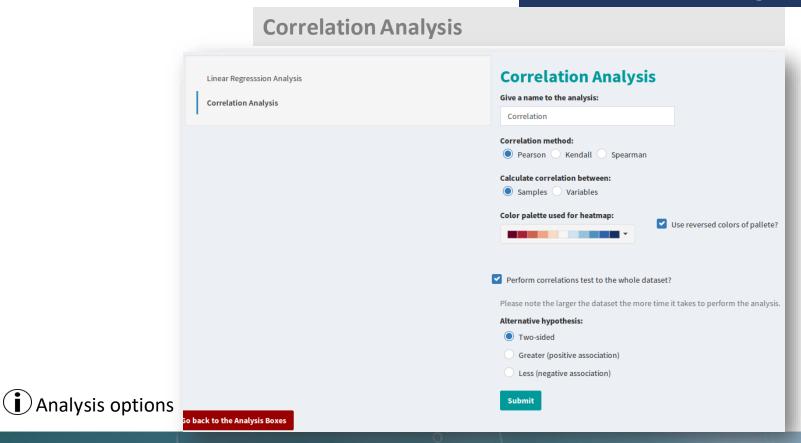




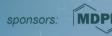




Regression Analysis



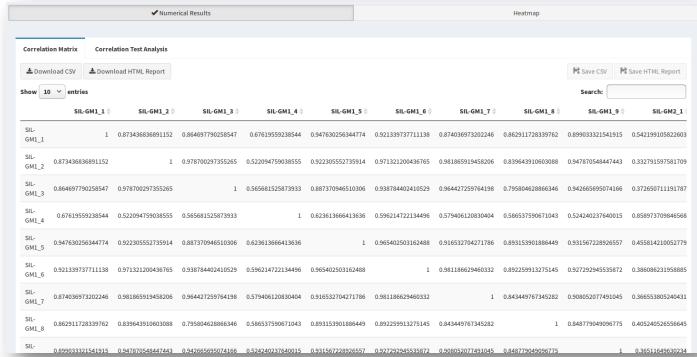






Regression Analysis

Correlation Analysis



Types of results available for this type of analysis: numerical results

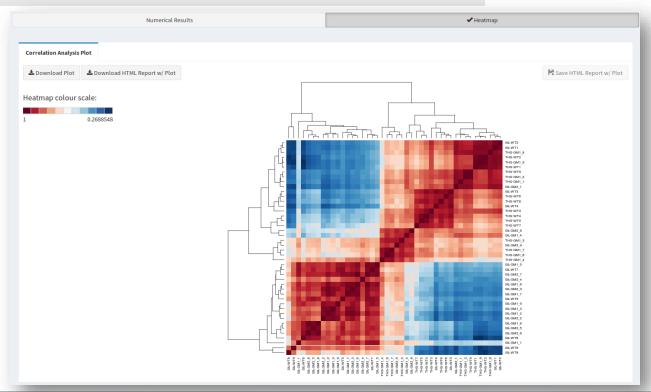






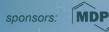
Regression Analysis

Correlation Analysis



Types of results available for this type of analysis: plot results

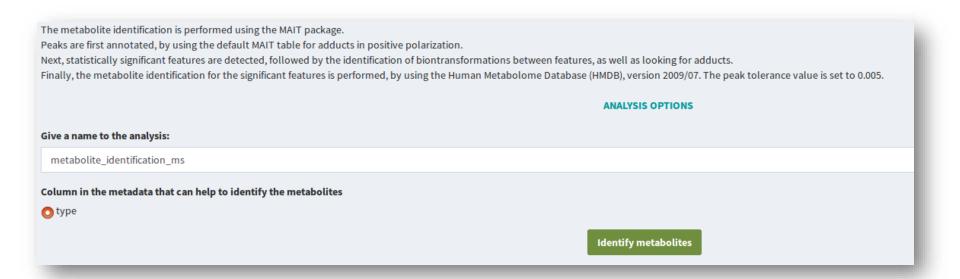






Metabolite Identification

LC-MS Data



i Analysis options







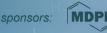
Metabolite Identification

LC-MS Data

Name	♦ ENTRY ♦	Query Mass	Database Mass (neutral mass)	Retention Time	Isotope 🖣 Adduct		Biofluid \$	p.adj
Pyridinoline	HMDB0000851	429.2	428.190704	64.78	[27][M]+	27	Blood; Urine	0.18854740962550
Biotripyrrin-a	HMDB0003323	466.2	465.189972	61.63	[34][M]+	32	Not Available	0.42901406404922
Biotripyrrin-b	HMDB0003324	466.2	465.189972	61.63	[34][M]+	32	Not Available	0.42901406404922
6-Hydroxymelatonin	HMDB0004081	249.1239	248.116089	61.13	[3][M]+	41	Blood	0.8590897674511
Imipramine	HMDB0001848	281.2	280.193939	61.13		41	Not Available	0.87972147048112
Valproic acid glucuronide	HMDB0000901	321.1537	320.147125	61.12		41	Urine	0.79741876856179
Octanoylglucuronide	HMDB0010347	321.1537	320.147125	61.12		41	Not Available	0.79741876856179
N-Acetylaspartylglutamic acid	HMDB0001067	305.1	304.090668	48.78	[10][M]+	43	Blood; Cerebrospinal Fluid; Urine	0.22057111800074
12-oxo-20-dihydroxy-leukotriene B4	HMDB0012551	366.2048	365.196411	64.12		45	Not Available	0.87919554813501
PE(P-16:0e/0:0)	HMDB0011152	438.3	437.290619	67.6	[30][M]+	49	Not Available	0.010576994787257
N-Acetylaspartylglutamic acid	HMDB0001067	305.1	304.090668	58.4	[11][M]+	50	Blood; Cerebrospinal Fluid; Urine	0.8957357441510

Results available for this type of analysis

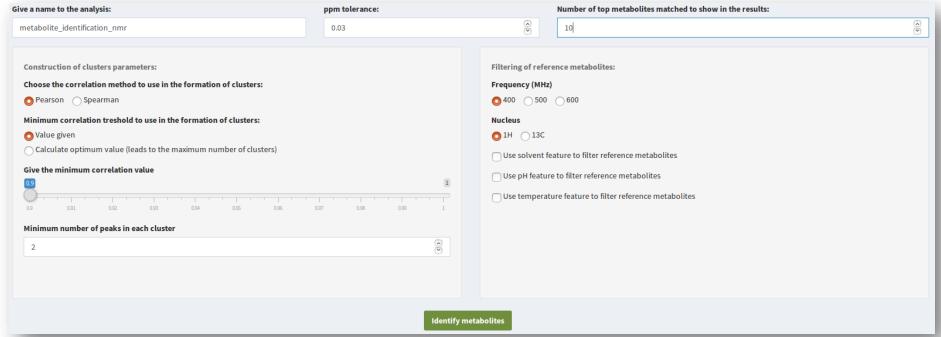






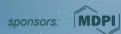
Metabolite Identification

NMR Data



i Analysis options







Metabolite Identification

NMR Data

		Results Table	Results for each Cluster					
				Search:				
Metabolite 🖣	Metabolite.Name 🍦	Reference.Peaks.Matched	Cluster.Peaks.Matched	Cluster 🔷	Jaccard.Index			
MDB0001547	Corticosterone	$0.931; 0.983; 0.991; 1.01; 1.06; 1.071; 1.092; 1.121; 1.147; 1.402; 1.416; 1.433; 1.462; 1.572; 1.58; 1.606; 1.79; \\ 1.811; 1.994; 2.002; 2.025; 2.05; 2.091; 2.125; 2.178; 2.184; 2.202; 2.235; 2.263; 2.329; 2.36; 2.37; 2.382; 2.41; \\ 2.449; 2.471; 2.502; 3.348; 3.35; 3.358; 4.182; 4.191; 4.206; 4.415; 5.68; 5.683$	0.93; 0.96; 0.99; 1.02; 1.06; 1.08; 1.11; 1.15; 1.17; 1.4; 1.43; 1.46; 1.49; 1.55; 1.57; 1.62; 1.82; 1.84; 1.99; 2.01; 2.05; 2.08; 2.11; 2.14; 2.17; 2.2; 2.23; 2.26; 2.29; 2.32; 2.34; 2.38; 2.41; 2.44; 2.47; 2.5; 2.53; 3.32; 3.35; 3.38; 4.17; 4.21; 4.23; 4.4; 5.67; 5.7	1	0.12			
MDB0000016	Deoxycorticosterone	0.695; 0.976; 0.984; 1.003; 1.082; 1.085; 1.092; 1.175; 1.18; 1.192; 1.223; 1.34; 1.348; 1.371; 1.404; 1.431; 1.461; 1.562; 1.57; 1.59; 1.627; 1.66; 1.794; 1.856; 1.937; 1.967; 2.011; 2.023; 2.053; 2.218; 2.223; 2.246; 2.268; 2.298; 2.315; 2.357; 2.384; 2.413; 2.442; 2.479; 2.503; 3.317; 3.319; 4.189; 4.204; 5.736	0.69; 0.96; 0.99; 1.02; 1.06; 1.08; 1.11; 1.15; 1.17; 1.21; 1.24; 1.34; 1.37; 1.4; 1.43; 1.46; 1.49; 1.55; 1.57; 1.62; 1.65; 1.67; 1.82; 1.84; 1.96; 1.99; 2.01; 2.05; 2.08; 2.2; 2.23; 2.26; 2.29; 2.32; 2.34; 2.38; 2.41; 2.44; 2.47; 2.5; 2.53; 3.3; 3.32; 4.17; 4.21; 5.75	1	0.12			
MDB0001830	Progesterone	0.67; 0.982; 0.991; 1.01; 1.163; 1.168; 1.18; 1.211; 1.25; 1.437; 1.449; 1.48; 1.547; 1.556; 1.576; 1.628; 1.632; 1.645; 1.851; 2.025; 2.03; 2.051; 2.083; 2.13; 2.144; 2.175; 2.202; 2.295; 2.301; 2.312; 2.357; 2.38; 2.41; 2.445; 2.522; 2.545; 2.567; 5.735	0.66; 0.96; 0.99; 1.02; 1.15; 1.17; 1.21; 1.24; 1.27; 1.43; 1.46; 1.49; 1.52; 1.55; 1.57; 1.62; 1.65; 1.67; 1.84; 2.01; 2.05; 2.08; 2.11; 2.14; 2.17; 2.2; 2.23; 2.29; 2.32; 2.34; 2.38; 2.41; 2.44; 2.47; 2.5; 2.53; 2.56; 5.75	1	0.10			
MDB0000234	Testosterone	0.794; 0.921; 0.932; 0.962; 0.991; 1.047; 1.058; 1.08; 1.197; 1.285; 1.3; 1.316; 1.414; 1.424; 1.44; 1.461; 1.49; 1.561; 1.57; 1.599; 1.62; 1.654; 1.834; 1.846; 2.007; 2.015; 2.02; 2.053; 2.081; 2.133; 2.286; 2.293; 2.297; 2.351; 2.357; 2.383; 2.418; 3.649; 5.731	0.79; 0.93; 0.96; 0.99; 1.02; 1.06; 1.08; 1.11; 1.17; 1.27; 1.3; 1.34; 1.4; 1.43; 1.46; 1.49; 1.52; 1.55; 1.57; 1.62; 1.65; 1.67; 1.82; 1.84; 1.99; 2.01; 2.05; 2.08; 2.11; 2.14; 2.26; 2.29; 2.32; 2.34; 2.38; 2.41; 2.44; 3.62; 5.75	1	0.10			
MDB0000054	Bilirubin	1.945; 1.961; 1.982; 2.022; 2.073; 2.164; 2.436; 2.455; 2.475; 2.515; 2.52; 2.532; 4.006; 5.285; 5.292; 5.314; 5.597; 5.601; 5.645; 6.093; 6.164; 6.208; 6.533; 6.562; 6.577; 6.606; 6.754; 6.784; 6.797; 6.827	1.96; 1.99; 2.01; 2.05; 2.08; 2.14; 2.41; 2.44; 2.47; 2.5; 2.53; 2.56; 4.02; 5.27; 5.31; 5.34; 5.57; 5.61; 5.64; 5.67; 6.11; 6.17; 6.21; 6.51; 6.58; 6.6; 6.62; 6.75; 6.78; 6.81; 6.85	1	0.08			
MDB0000488	4E,15Z-Bilirubin IXa	1.945; 1.961; 1.982; 2.022; 2.073; 2.164; 2.436; 2.455; 2.475; 2.515; 2.52; 2.532; 4.006; 5.285; 5.292; 5.314; 5.597; 5.601; 5.645; 6.093; 6.164; 6.208; 6.533; 6.562; 6.577; 6.606; 6.754; 6.784; 6.797; 6.827	1.96; 1.99; 2.01; 2.05; 2.08; 2.14; 2.41; 2.44; 2.47; 2.5; 2.53; 2.56; 4.02; 5.27; 5.31; 5.34; 5.57; 5.61; 5.64; 5.67; 6.11; 6.17; 6.21; 6.51; 6.58; 6.6; 6.62; 6.75; 6.78; 6.81; 6.85	1	0.08			
wing 1 to 10 of	f 10 entries							
Download H	TML & Download CS	SV Download EXCEL	► Save HTML	Save CSV	Save EXC			

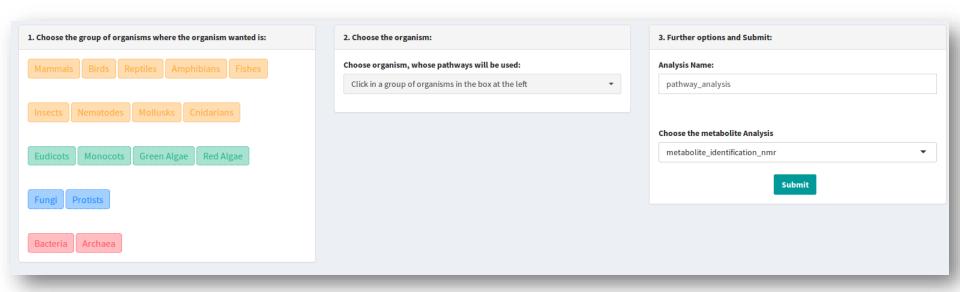
Results available for this type of analysis







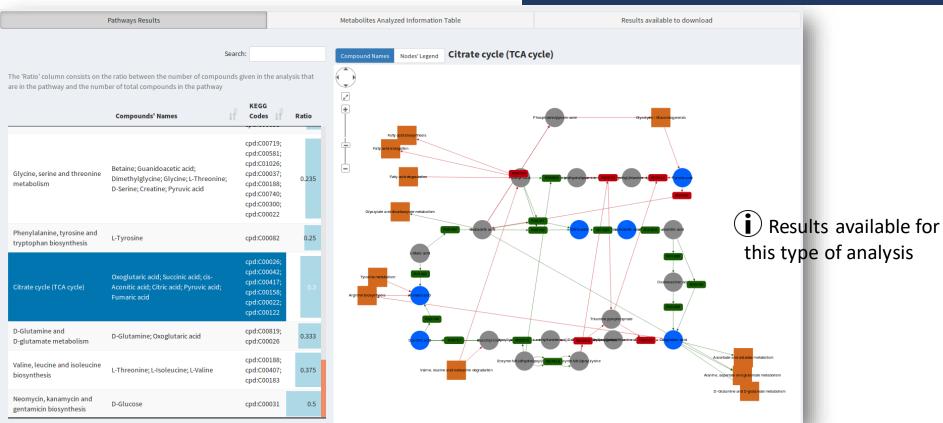
Pathway Analysis



Analysis options



Pathway Analysis

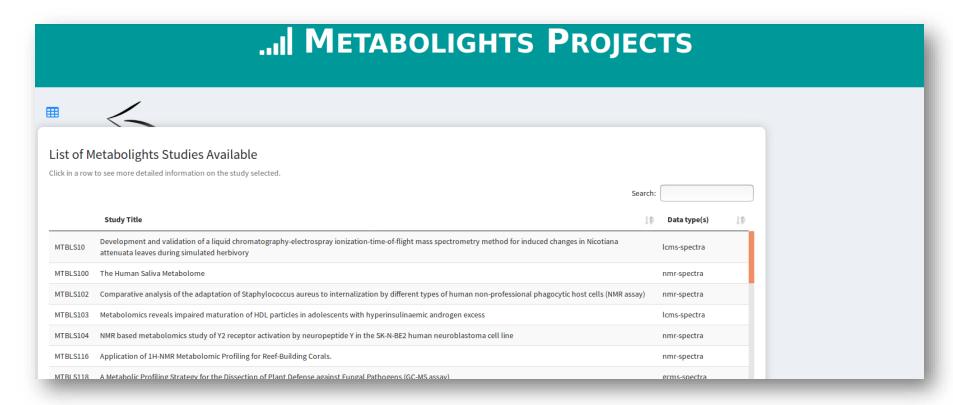








WebSpecmine: Analysis of MetaboLights Studies



i You can see information on some of the MetaboLights studies



WebSpecmine: Analysis of MetaboLights Studies



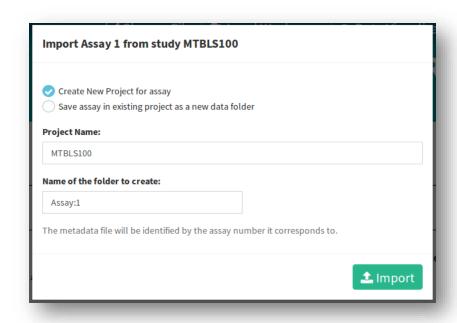
i You can see detailed information on the protocol and metadata information on each assay







WebSpecmine: Analysis of MetaboLights Studies



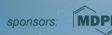
i You can download the data and metadata of an assay into your private account and analyse it



Conclusions

- ✓ We were able to create an easy-to-use and freely available website with many advantages:
 - Wide variety of techniques and data formats supported
 - Wide variety of pre-processing methods
 - Wide variety of analysis methods
 - Flexible Pipeline
 - User Account
- ✓ However, more analyses could be added, to add more biological meaning to data, such as:
 - Enrichment Analysis
 - Biomarker Analysis







For More Detailed Information ...

Website Link: https://webspecmine.bio.di.uminho.pt/



We have Tutorials and a complete User Guide at the *?Help* page.

We have a troubleshooting window, from where the users can report any problems and see the problems already encountered, but still being solved.





Acknowledgments





Universidade do Minho Escola de Engenharia Christopher Costa, for being the main developer of the *specmine* R package











