



# Metabolomic Approaches for PGR

Esra Karakas

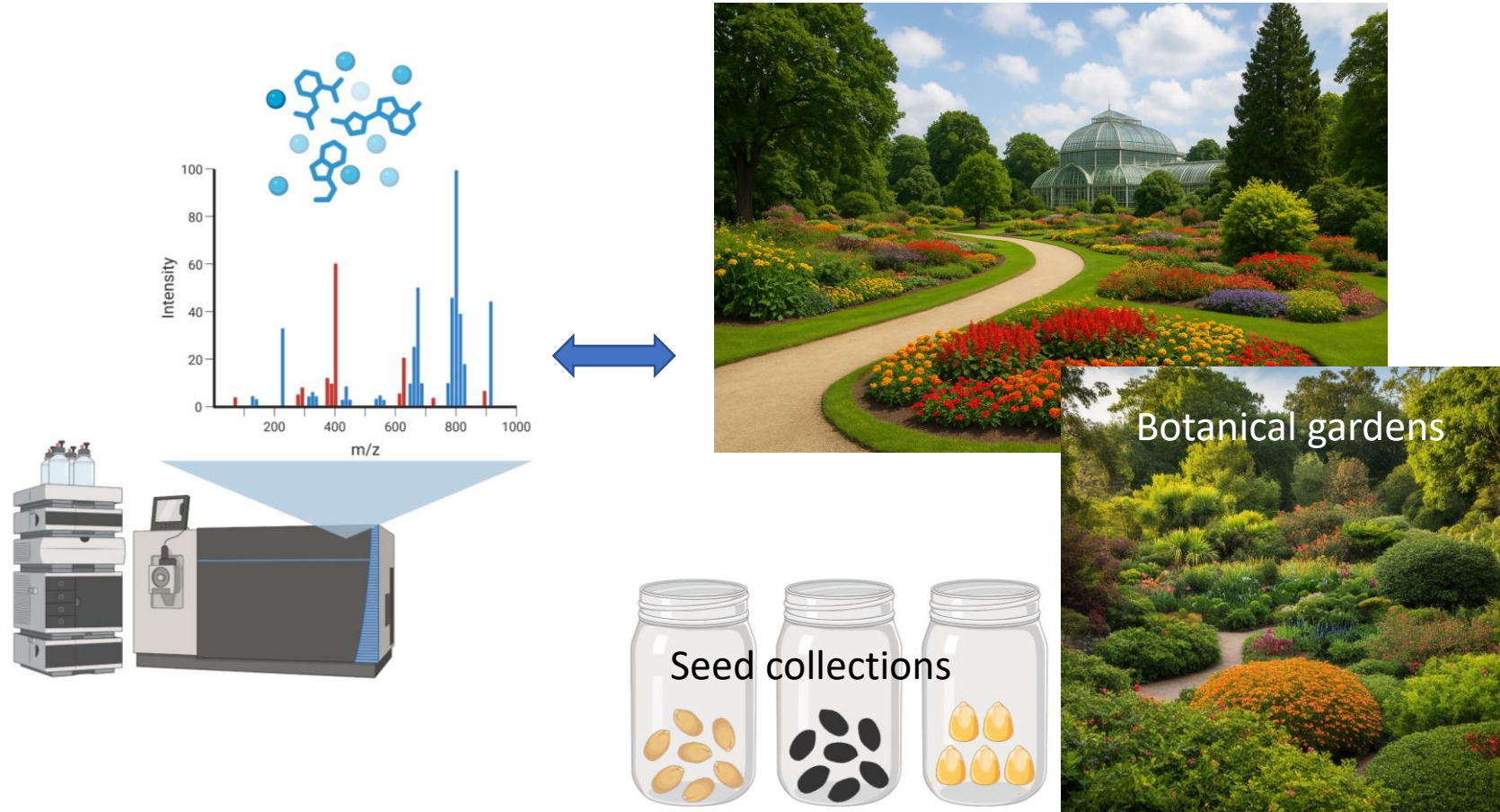
Max Planck Institute of Molecular Plant Physiology

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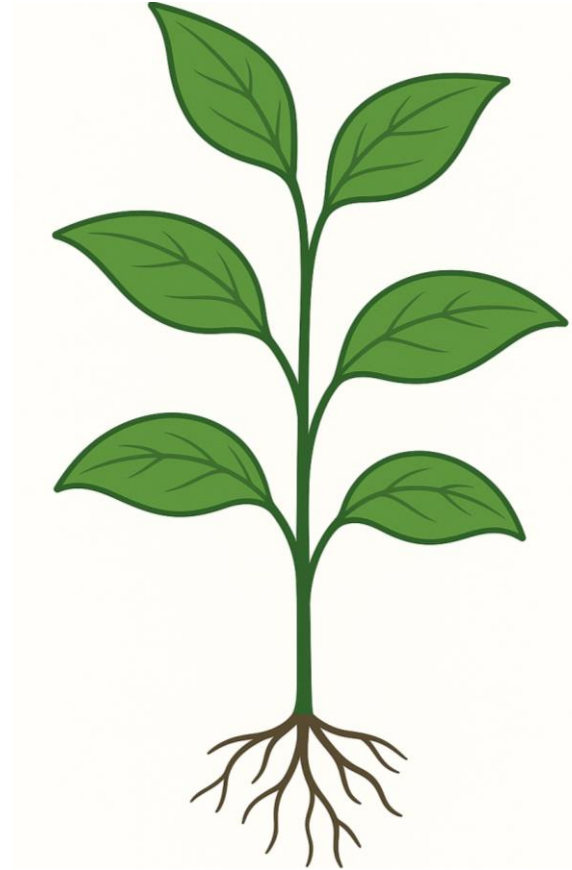
# Plant genetic resources as a source of variation

- Plant genetic resources (PGR) (wild relatives, seed banks, germplasm collections) hold a vast pool of genetic diversity.
- Metabolomics provides a high-throughput tool to profile metabolites from diverse PGR.



# Metabolomics and Plant Metabolism

- **Metabolomics** is an approach of study that involves the comprehensive analysis of small molecules, known as **metabolites**, present in biological samples.
- Metabolomics is usually performed by targeting either a specific cell, a specific tissue, or the entire organism (Shen et al., 2023, Molecular Plant).



## Primary metabolites (Development)

- Fatty acids
- Lipids
- Sugars
- Amino acids
- Others



## Secondary metabolites (Environmental Interactions)

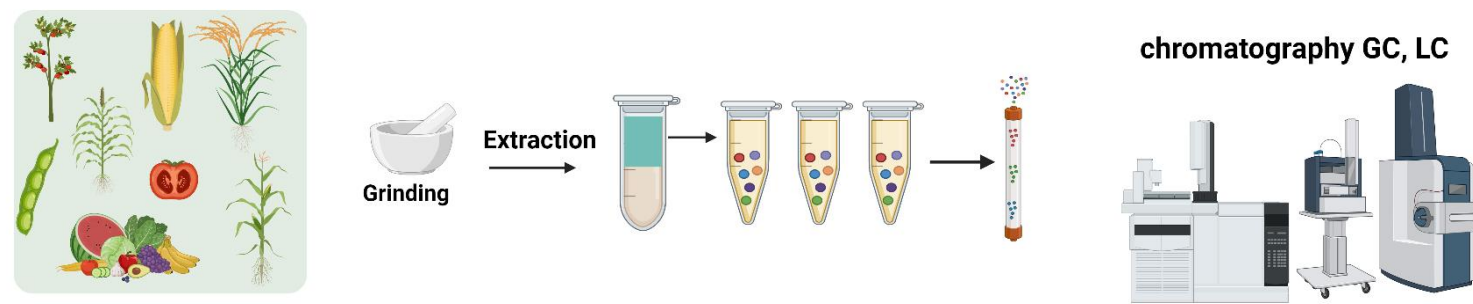
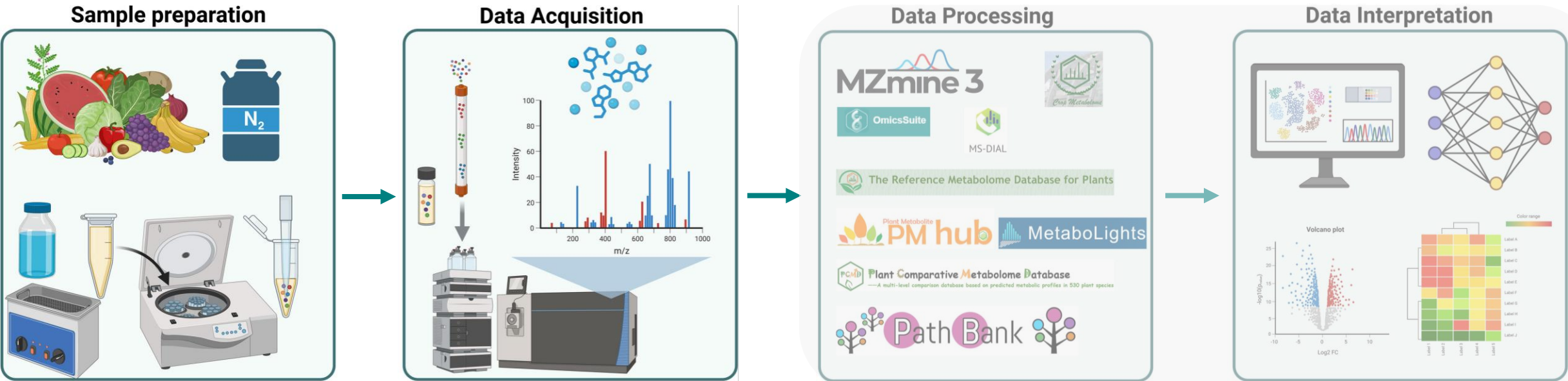
- Phenolics
- Terpenes
- Carotenoids
- Flavonoids



## Hormones (Regulation)

- Auxins
- Gibberellins
- Jasmonic acids
- Abscic acid

# Metabolomics Approach from Sample Preparation to Data Interpretation



# Metabolomics Techniques

- Gas Chromatography Mass Spectrometry (GC-MS)
- Liquid Chromatography Mass Spectrometry (LC-MS)

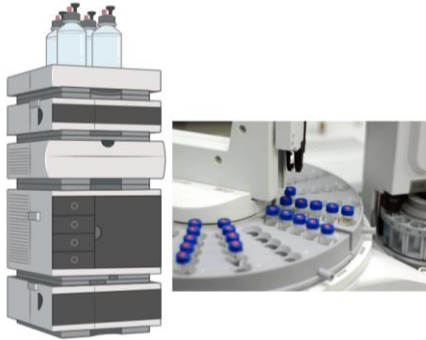
Mass analyzers are available;

- ✓ Quadrupole,
- ✓ Time-of-flight (TOF),
- ✓ Orbitrap
- ✓ Ion trap

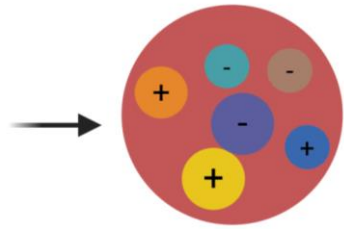
- ✓ Electrospray ionization (ESI),
- ✓ atmospheric pressure chemical ionization (APCI),
- ✓ atmospheric pressure photo-ionization (APPI)



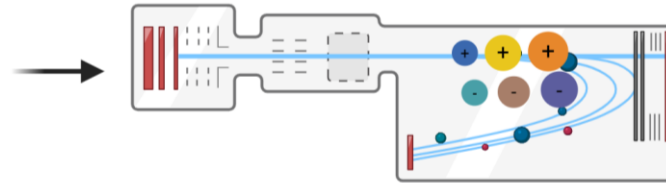
**Chromatography**  
GC, LC, EC



**Mass spectrometry**  
TOF, Orbitrap, Q, IT

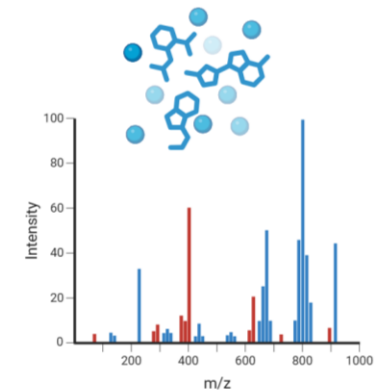


**Ionization**



**Separation of ions**

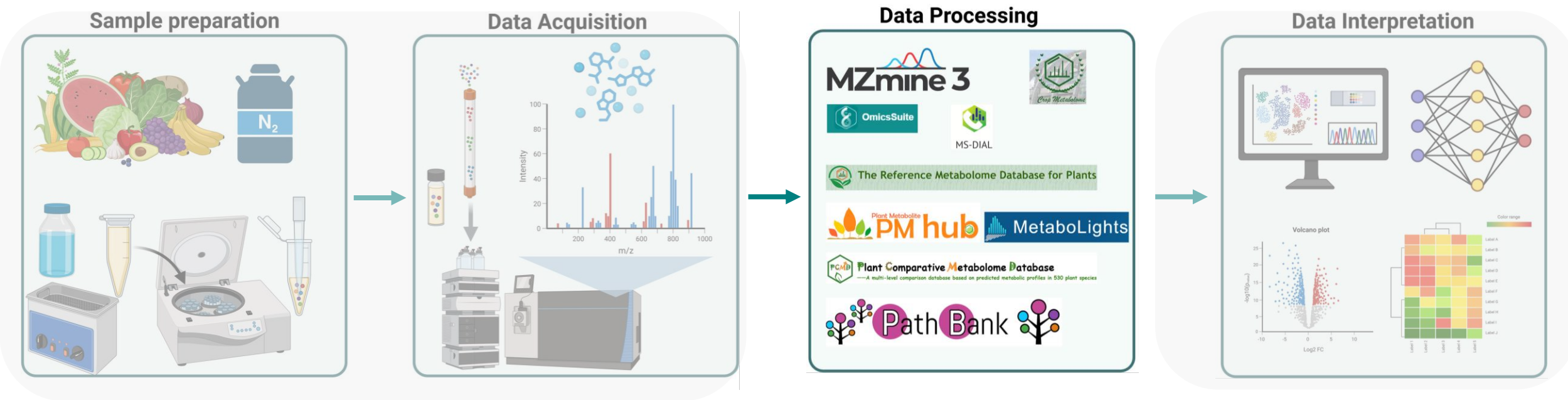
**Detector**



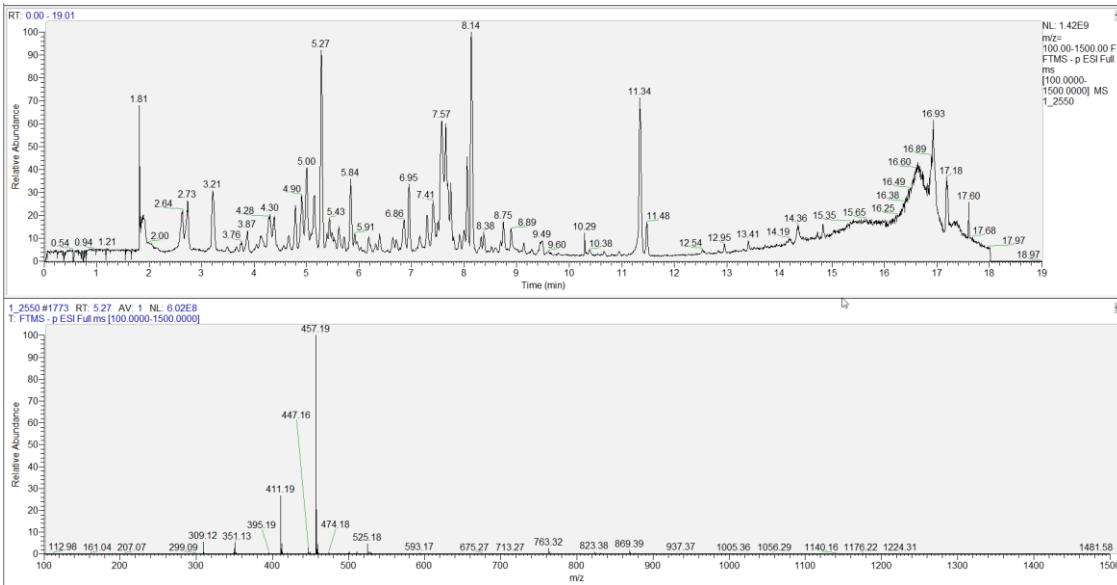
**Chromatogram detection**



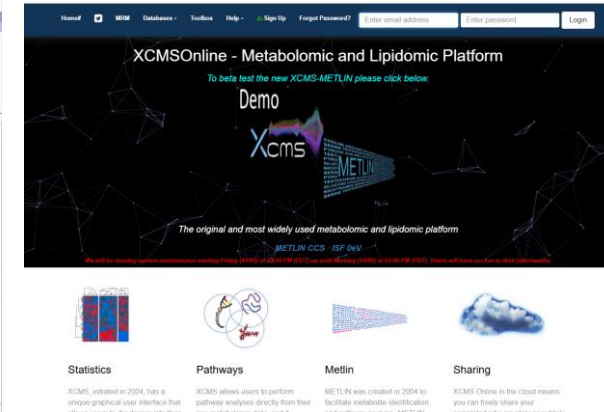
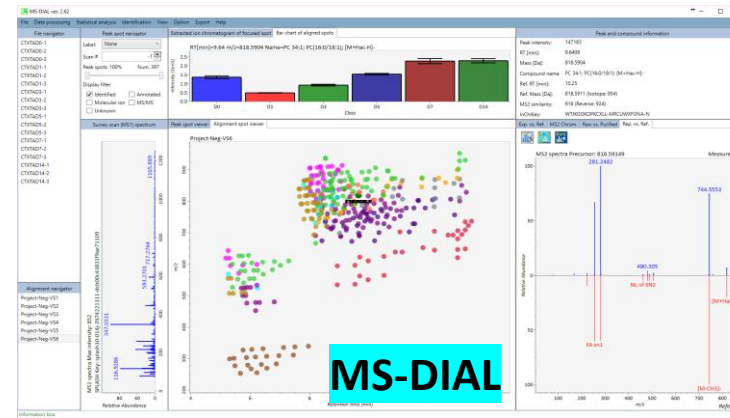
# Metabolomics Approach from Sample Preparation to Data Interpretation



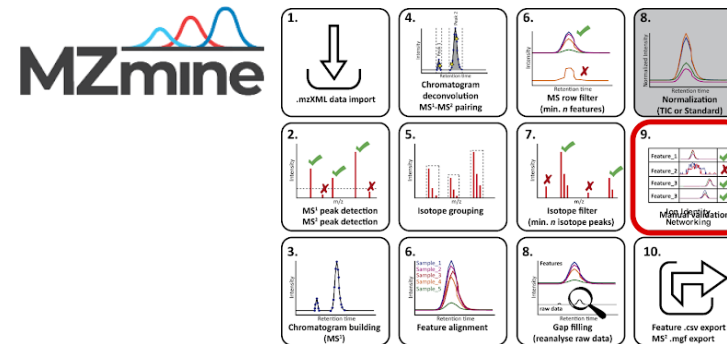
# Chromatogram Processing and Data Analysis



## Data pre-processing peak alignment, feature detection



- Several free data processing tools are available to automatically detect mass features generating chromatographic peaks, and compare peak intensities across multiple samples, as a proxy for metabolite concentration.
- Accurate mass and fragmentation measurements, combined with informative data, are obtained using various software tools for metabolite annotation, including R packages such as;
  - ✓ CAMERA
  - ✓ RAMclust
  - ✓ xMSannotator
  - ✓ MetAssign



OpenMS

# Chromatogram Processing and Data Analysis

**NIH** National Library of Medicine  
National Center for Biotechnology Information

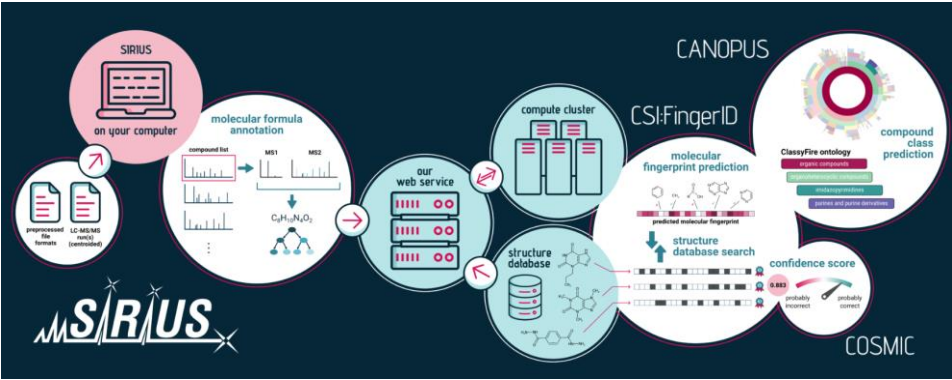
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Giga Science, 6, 2017, 1–20  
doi: 10.1093/gigascience/gix037  
Advance Access Publication Date: 17 May 2017  
Review

## REVIEW

From chromatogram to analyte to metabolite. How to pick horses for courses from the massive web resources for mass spectral plant metabolomics

Leonardo Perez de Souza, Thomas Naake, Takayuki Tohge and Alisdair R. Fernie\*

Max-Planck-Institute of Molecular Plant Physiology, Am Mühlenberg 1, 14476 Potsdam-Golm, Germany

\*Correspondence address: Alisdair R. Fernie, Max-Planck-Institute of Molecular Plant Physiology, Am Mühlenberg 1, 14476 Potsdam-Golm, Germany.  
Tel.: +49 (0)331 567 8211; Fax: +49 (0)331 567 8250; E-mail: fernie@mpimp-golm.mpg.de

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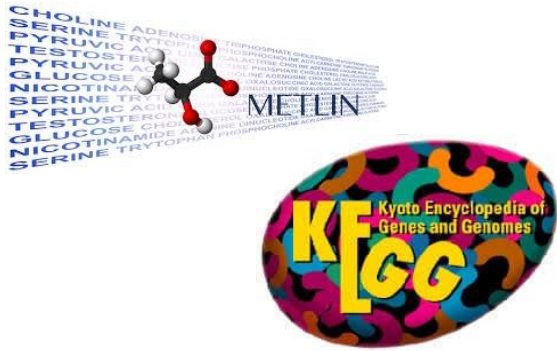
Q Search compound name, SMILES, InChI, InChI Key

Try Caffeine CN1C=NC2=C1C(=O)N(C(=O)N2C)C

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**MassBank**  
High Quality Mass Spectral Database



**Horticulture Advances**

## REVIEW

## Open Access

# The use of web resources for metabolomics in horticultural crops

Esra Karakas<sup>1</sup>, Mustafa Bulut<sup>1</sup> and Alisdair R. Fernie<sup>1\*</sup>

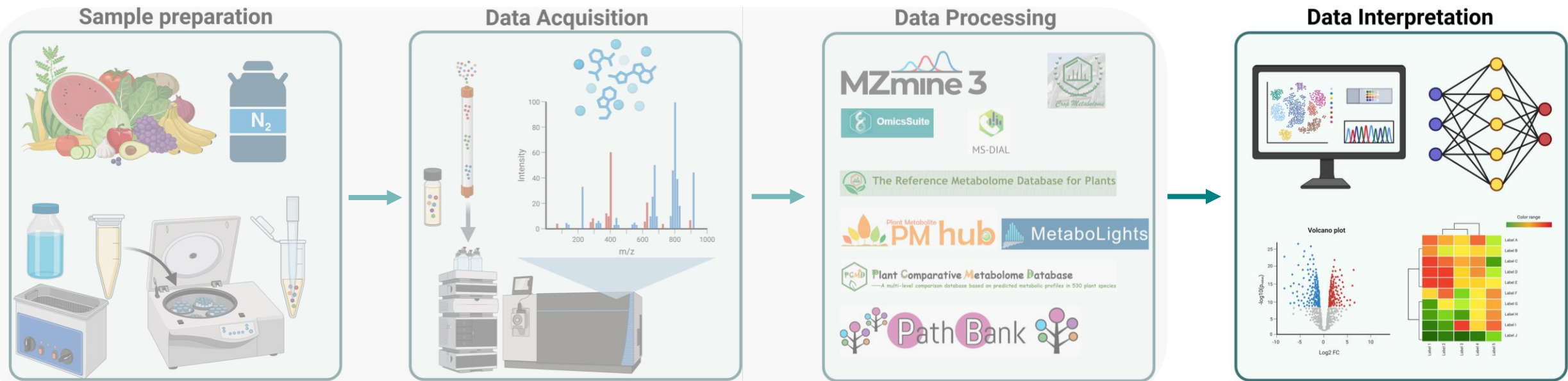
**Table 1** The recent metabolomics databases

Metabolomics databases	References	Link	Methodology	Species Scope
<b>LC–MS/GC–MS Centric Databases</b>				
METASPACE-ML	(Wadie et al. 2024)	<a href="https://apps.embl.de/metaspaceml/">https://apps.embl.de/metaspaceml/</a>	LC–MS	Multi-species
MetFrag	(Ruttikies et al. 2016)	<a href="https://msbi.jp-b.halle.de/MetFrag/">https://msbi.jp-b.halle.de/MetFrag/</a>	LC–MS/MS	Multi-species
LIPID MAPS	(Conroy et al. 2024)	<a href="http://www.lipidmaps.org">www.lipidmaps.org</a>	LC–MS, GC–MS	Multi-species
LipidSig 2.0	(Liu et al. 2024)	<a href="https://lipidsig.bioinformatics.org/">https://lipidsig.bioinformatics.org/</a>	LC–MS	Multi-species
LipidSuite	(Mohamed and Hill 2021)	<a href="http://suite.lipid.org">http://suite.lipid.org</a>	LC–MS	Multi-species
COCONUT	(Sorokina et al. 2021)	<a href="https://coconut.naturalproducts.net">https://coconut.naturalproducts.net</a>	LC–MS	Multi-species
PathBank 2.0	(Wishart et al. 2024)	<a href="https://pathbank.org/">https://pathbank.org/</a>	Pathway integration	Multi-species
SCIPDb	(Priya et al. 2023)	<a href="http://223.31.159.3/plant_compilte/index_orangesunset.php">http://223.31.159.3/plant_compilte/index_orangesunset.php</a>	LC–MS	Multi-species
<b>Multi-Platform Databases (LC–MS, NMR)</b>				
MetaboLights	(Yurekten et al. 2024)	<a href="https://www.ebi.ac.uk/metabolights/">https://www.ebi.ac.uk/metabolights/</a>	LC–MS, GC–MS, NMR	Multi-species
PaintOmics 4	(Liu et al. 2022)	<a href="https://paintomics.org/">https://paintomics.org/</a>	Multi-omics	Multi-species
RefMetaPlant	(Shi et al. 2024a)	<a href="https://www.biosino.org/RefMetaDB/">https://www.biosino.org/RefMetaDB/</a>	LC–MS, NMR	Multi-species
OmicsSuite	(Miao et al. 2023)	<a href="https://omicssuite.github.io/#/">https://omicssuite.github.io/#/</a>	Multi-omics	Multi-species
ModelSEED	(Seaver et al. 2021)	<a href="https://modelseed.org/biochem">https://modelseed.org/biochem</a>	Genome-scale modelling	Multi-species
<b>Horticultural Crop-Specific Databases</b>				
TOMATOMET	(Ara et al. 2021)	<a href="https://metabolites.in/tomato-fruits/">https://metabolites.in/tomato-fruits/</a>	LC–MS, GC–MS	Tomato
PMHub 1.0	(Tian et al. 2024)	<a href="https://pmhub.org.cn/#/">https://pmhub.org.cn/#/</a>	LC–MS	Multi-species
MMHub	(Li et al. 2020)	<a href="https://biobdbs.swu.edu.cn/mmdbs/">https://biobdbs.swu.edu.cn/mmdbs/</a>	LC–MS	Mulberry
ArecaceaeMDB	(Yang et al. 2023a)	<a href="http://arecaceae-gdb.com/#/">http://arecaceae-gdb.com/#/</a>	LC–MS	Arecaceae (Palms)
LettuceGDB	(Guo et al. 2023)	<a href="https://www.lettucegdb.com/">https://www.lettucegdb.com/</a>	LC–MS	Lettuce
BoGDB	(Wang et al. 2022)	<a href="http://www.bogdb.com/">http://www.bogdb.com/</a>	LC–MS	Brassica oleracea
BnIR	(Yang et al. 2023b)	<a href="http://yanglab.hzau.edu.cn/BnIR">http://yanglab.hzau.edu.cn/BnIR</a>	LC–MS	Brassica napus
PlantMetSuite	(Liu et al. 2023)	<a href="https://plantmetsuite.verifygenome.com/">https://plantmetsuite.verifygenome.com/</a>	LC–MS	Multi-species
Corriander Genomics Database	(Song et al. 2020)	<a href="http://cgdb.bio2db.com/">http://cgdb.bio2db.com/</a>	LC–MS	Corriander and carrot
Metabolite Database for RTB	(Price et al. 2020)	(Supplementary files of the original article)	LC–MS, GC–MS	Banana, cassava, potato, sweet potato, yam
<b>Broad-Spectrum Plant Metabolomics Databases</b>				
Plant Reactome Knowledgebase	(Gupta et al. 2024)	<a href="https://plantreactome.gramene.org">https://plantreactome.gramene.org</a>	Pathway-based	Multi-species
PMN 16	(Hawkins et al. 2025)	<a href="https://plantcyc.org/">https://plantcyc.org/</a>	Pathway-based	Multi-species
MetaCyc	(Caspi et al. 2020)	<a href="https://metacyc.org/">https://metacyc.org/</a>	Pathway-based	Multi-species
CropMetabolome	(Shi et al. 2024b)	<a href="http://www.cropmetabolome.com/">http://www.cropmetabolome.com/</a>	LC–MS, GC–MS	Multiple Crops
Metadb	(Gao et al. 2024)	<a href="http://medmetadb.ynau.edu.cn">http://medmetadb.ynau.edu.cn</a>	LC–MS	Multi-species
HyporIPAtlas	(Lee et al. 2023)	<a href="https://hyporipatlas.npanalysis.org/">https://hyporipatlas.npanalysis.org/</a>	LC–MS/MS	Plants and microbes
<b>Databases Emphasizing Secondary Metabolites and Natural Products</b>				
MPOD	(He et al. 2022)	<a href="http://medicinalplants.ynau.edu.cn/">http://medicinalplants.ynau.edu.cn/</a>	LC–MS	Medicinal and food plants
CMAUP	(Zeng et al. 2019)	<a href="http://bidd2.nus.edu.sg/CMAUP/">http://bidd2.nus.edu.sg/CMAUP/</a>	LC–MS	Medicinal plants
<b>Meta-Analysis and Data Integration Tools</b>				
MODMS	(Fang et al. 2023)	<a href="https://modms.lzu.edu.cn/">https://modms.lzu.edu.cn/</a>	LC–MS, RNA-seq	Medicago sativa
PCMD	(Hu et al. 2024)	<a href="https://yanglab.hzau.edu.cn/PCMD">https://yanglab.hzau.edu.cn/PCMD</a>	LC–MS, GC–MS	Multi-species
The Thing Metabolome Repository family (XMRs)	(Sakurai et al. 2023)	<a href="https://metabolites.in/plants/">https://metabolites.in/plants/</a>	LC–MS	Multi-species
WikiPathways	(Slenter et al. 2018)	<a href="http://www.wikipathways.org">wikipathways.org</a>	Pathway mapping	Multi-species
MDSi	(Li et al. 2023)	<a href="http://sky.sxau.edu.cn/MDSi.htm">http://sky.sxau.edu.cn/MDSi.htm</a>	LC–MS/MS	Setaria italica
PEO	(Koh et al. 2024)	<a href="https://expression.plant.tools/">https://expression.plant.tools/</a>	LC–MS	Multi-species

Karakas et al., 2025, *Horticulture Advances*



# Metabolomics Approach from Sample Preparation to Data Interpretation



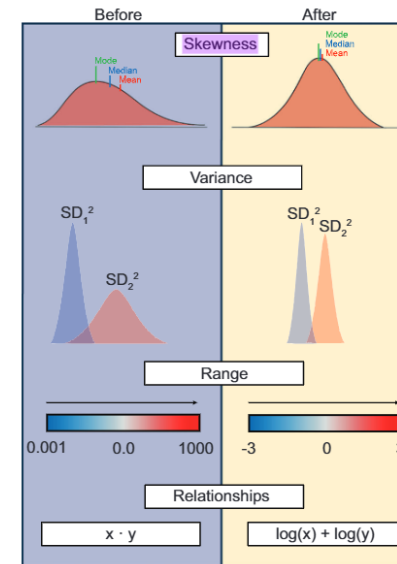
# Data Analysis

## Data normalization

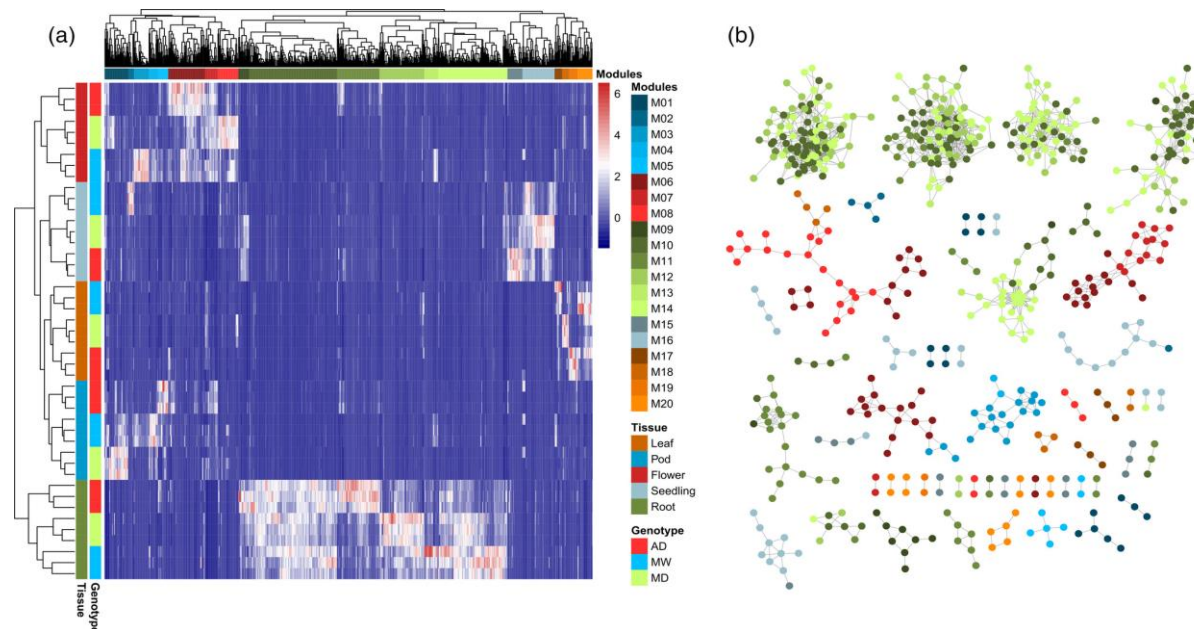
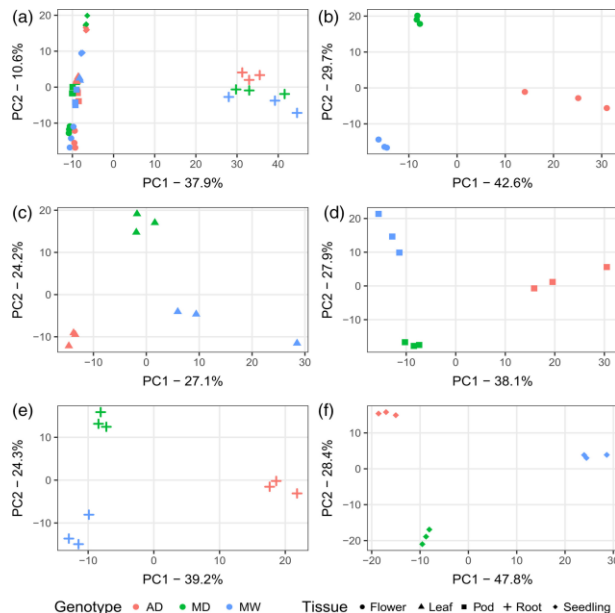
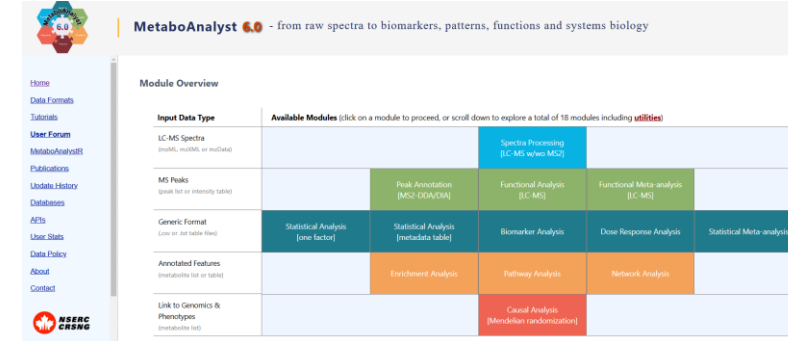
- ✓ Internal standards
- ✓ Median normalization
- ✓ Quality Control (QC) samples

## Data Transforming & Scaling

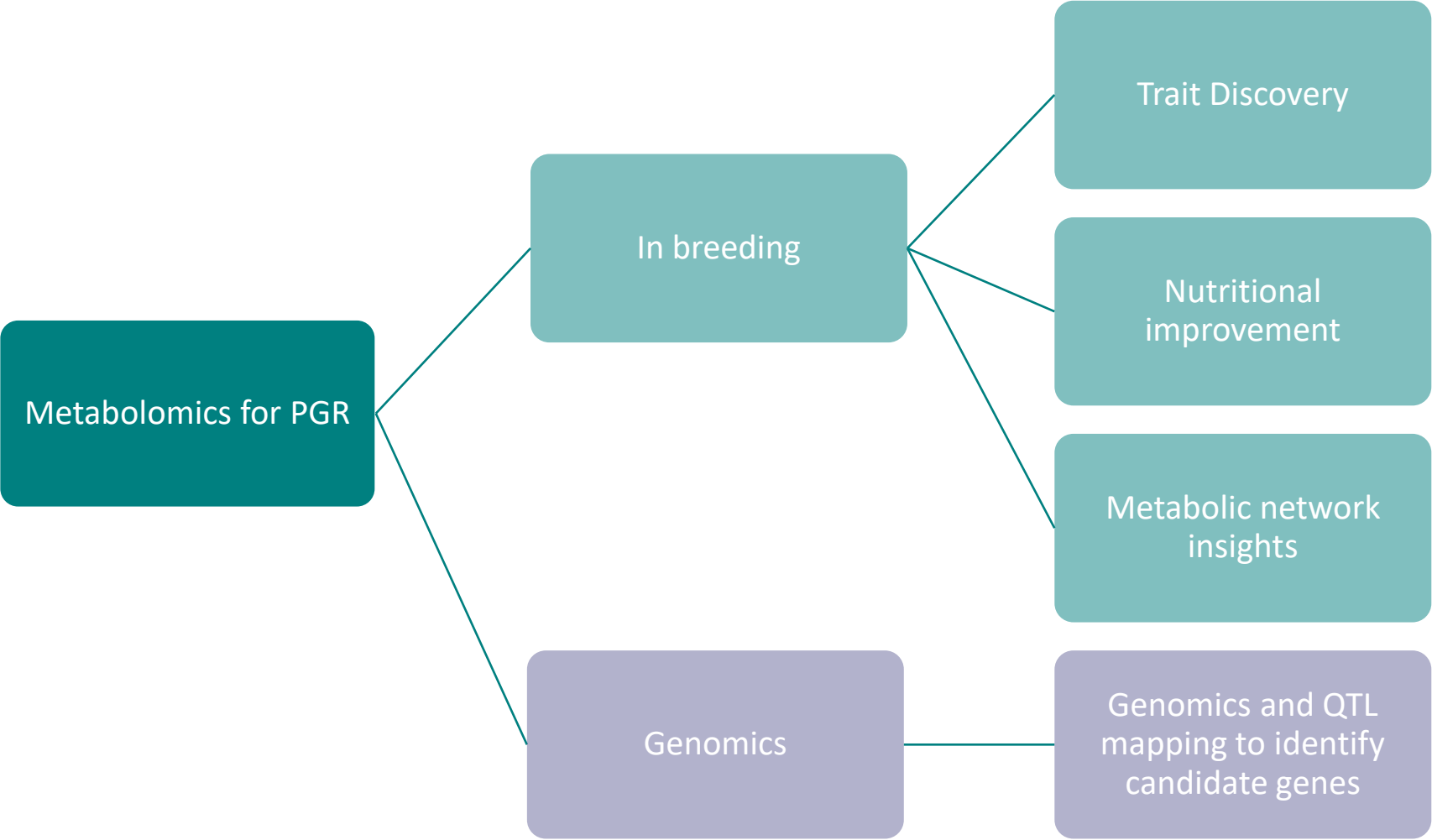
- ✓ Applying log transformation
- ✓ Pareto/auto scaling to reduce skew and make metabolites comparable



Idkowiak et al., 2025, *Nature Communications*



# Applications of Metabolomics for PGR



PRO-GRACE organizers

Thank you for your attention!

