# HoloFoodR: bridging the gap between data retrieval and data analysis in multi-omics

<u>Artur Sannikov</u><sup>2</sup>, Tuomas Borman<sup>1</sup>, Kati Hanhineva<sup>2</sup>, Leo Lahti<sup>1</sup>

<sup>1</sup>Department of Computing, University of Turku, <sup>2</sup>Department of Life Technologies, University of Turku <sup>2</sup>arsann@utu.fi <sup>6</sup>0000-0001-7765-123X



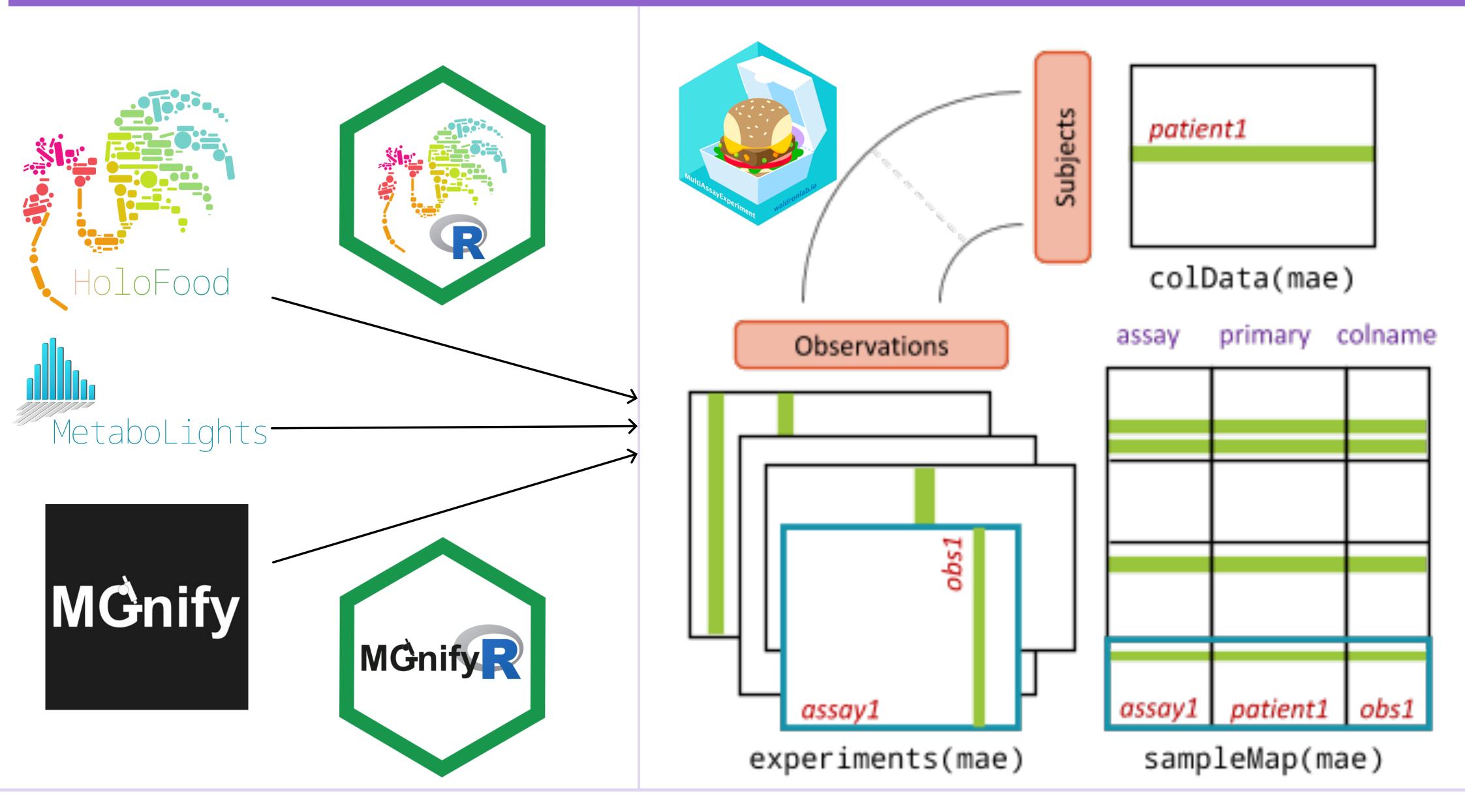
Check out HoloFoodR on Bioconductor

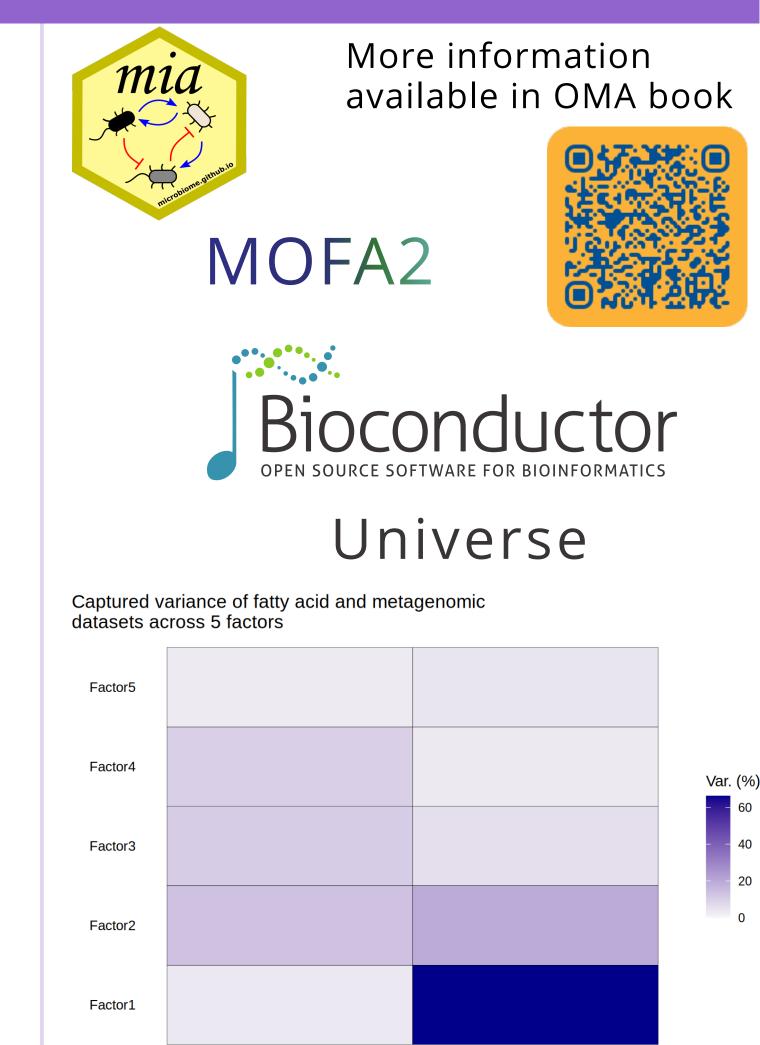


## Introduction

Holo-omic is a novel research field<sup>1</sup> that integrates multi-omic data from the host organism and its microbiome. Created by the HoloFood consortium, the openly available HoloFood database<sup>2</sup> grants access to the holo-omic data for over 2000 chickens and salmons. This database aims to study the impact of food additives on physiological and biomolecular parameters of farmed animals. However, access to such a wealthy database is complex and requires a profound understanding of the interrelations between various omic datasets, creating a gap between data availability and analytical frameworks.

## Framework





#### **Access and Retrieve**

complex multi-omic data on hosts and microbiome from HoloFood, the largest open holo-omicdatabase Seamlessly integrate HoloFood

Seamlessly integrate HoloFood data with metagenomic data from MGnify and metabolomic data from MetaboLights

#### Manage

data in MultiAssayExperiment, a Bioconductor container that unifies diverse biological datasets to accelerate discovery in multi-omics

MultiAssayExperiment simplifies access to more than 2300 R/Bioconductor packages by reducing data handling complexity and facilitating robust, validated analysis

#### Discover

Figure 1. By using MultiAssayExperiment integration

with MOFA2 package, we reveal explained variance

captured by five factors across two datasets.

new knowledge about the impact of food additives on physiological processes in chickens and salmons to improve

Via the integration with MOFA2 we compute the captured variance of five factors across two datasets

### Results and conclusions

We have developed HoloFoodR, an R/Bioconductor package to bridge the gap between data, computing environments, and data analysis frameworks. Our package leverages the capabilities of multi-omic data containers that provide systematic means to store omics and associated metadata. We demonstrate our package with a case study in which we retrieve salmon data from HoloFood, integrate it with MGnify and perform common omic analysis steps, such as normalization, visualization of diversity, and machine learning. In particular, we opted to leverage the integration of MOFA2³ package with multi-omic data containers to compute captured variance across metagenomic and fatty acid datasets. In summary, HoloFoodR facilitates scientific discovery and enhances the efficiency of holo-omic data analysis, supporting the identification of novel biological relations.

# References

- 1. Limborg, Morten T. et al. Applied Hologenomics: Feasibility and Potential in Aquaculture. Trends in Biotechnology 2018;**36**:252–264.
- 2. https://www.holofooddata.org
- 3. Argelaguet, Ricard et al. MOFA+: A Statistical Framework for Comprehensive Integration of Multi-Modal Single-Cell Data. Genome Biology 2020;**21**:1–17.

# Acknowledgements

- 1. We are grateful to HoloFood consortium (https://www.holofood.eu) for providing the database without which this work would not be possible.
- 2. We also extend our thanks to Morten Tønsberg Limborg, Rob Finn, and Varsha Kale from the consortium for their support during the development of the package.
- 3. The illustration and logo of the multi-assay data container have been borrowed from the MultiAssayExperiment vignette (Artistic License 2.0). MetaboLights logo has been borrowed from MetaboLights source code (Apache License 2.0).









