

# A New Integrated Bioinformatics Tool for Metabolomic Data Handling

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## Literature

[1]  
ReadW: [http://tools.proteomecenter.org/wiki/index.php?title=Software:ReadW#Current\\_Version](http://tools.proteomecenter.org/wiki/index.php?title=Software:ReadW#Current_Version)

[2]  
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## Introduction

Until now there has been no tool that can handle  
everything from data conversion to compound  
identification let alone individualized storage of results,  
statistical analysis or management of projects, studies  
and experiments within one graphical user interface –  
i.e., an integrated bioinformatic tool.

## Aim

We designed and construct an integrated bioinformatic  
tool for

- 1) **processing of LC/FTMS raw data** generated by  
metabolomics studies, including peak picking, peak  
alignment and grouping across study samples by  
integrating the XCMS package<sup>[1]</sup>.
- 2) **organizing and archiving the processed raw  
data** for further statistical analysis and compound  
identification
- 3) **identification of compounds in the processed  
raw data** by accurate mass and retention time using  
system-specific databases and public compound DBs

## Methods

- Programming language: **Java**
- Database: **MySQL**
- Statistical programming language: **R**

## Results

We created JOANNEUM RESEARCH Metabolite  
Database – JRMDb (Fig. 1). The GUI is divided into three  
parts. In the left one tree shows projects, studies and  
experiments. The lower part shows a history of actions  
within a session. In the right part tables and plots can be  
displayed within tabs. JRMDb features:

- **Semi-automated data conversion** using ReadW<sup>[1]</sup>  
(from vendor-file format to standardized mzXML files)
- **Automated peak picking**, peak alignment and  
grouping of multiple sample batches utilizing the  
XCMS Package<sup>[2]</sup>
- **Data management system** to hierarchically organize  
the processed data from projects, studies and  
experiments
- **Data filtering tools** (e.g. Blank-, QC-, System-filter)  
(Fig. 2)
- **Compound identification** by
  - ▶ accurate mass and retention time using a system  
specific data base updated and maintained by the  
institute
  - ▶ accurate mass using public metabolite data bases  
(e.g. HMDB<sup>[3]</sup>, MetaCyc<sup>[4]</sup>, ChEBI<sup>[5]</sup>, LipidMaps<sup>[6]</sup>)
- **Data visualization tools** (e.g. EIC diagrams (Fig. 3),  
trend analysis, density plots, feature correlation plots,  
heatmaps, PCAs).

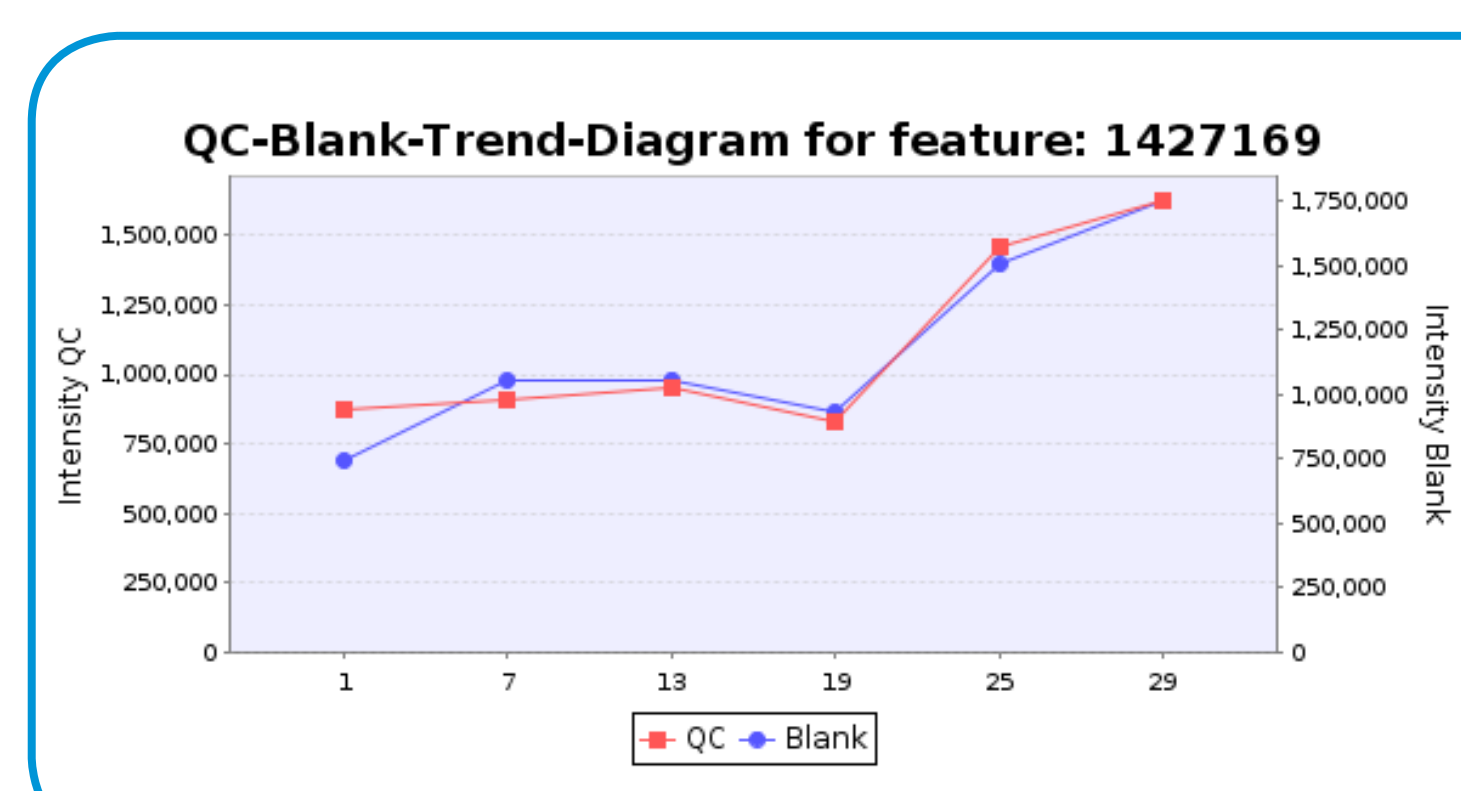


Figure 2: Shows an example of a feature filtered by the System-filter. We periodically mix in pairs of blank- and QC-samples (mix of all samples) during an analysis. If the intensities behave in the same way we assume the feature is just a peak generated by impurities in the system.

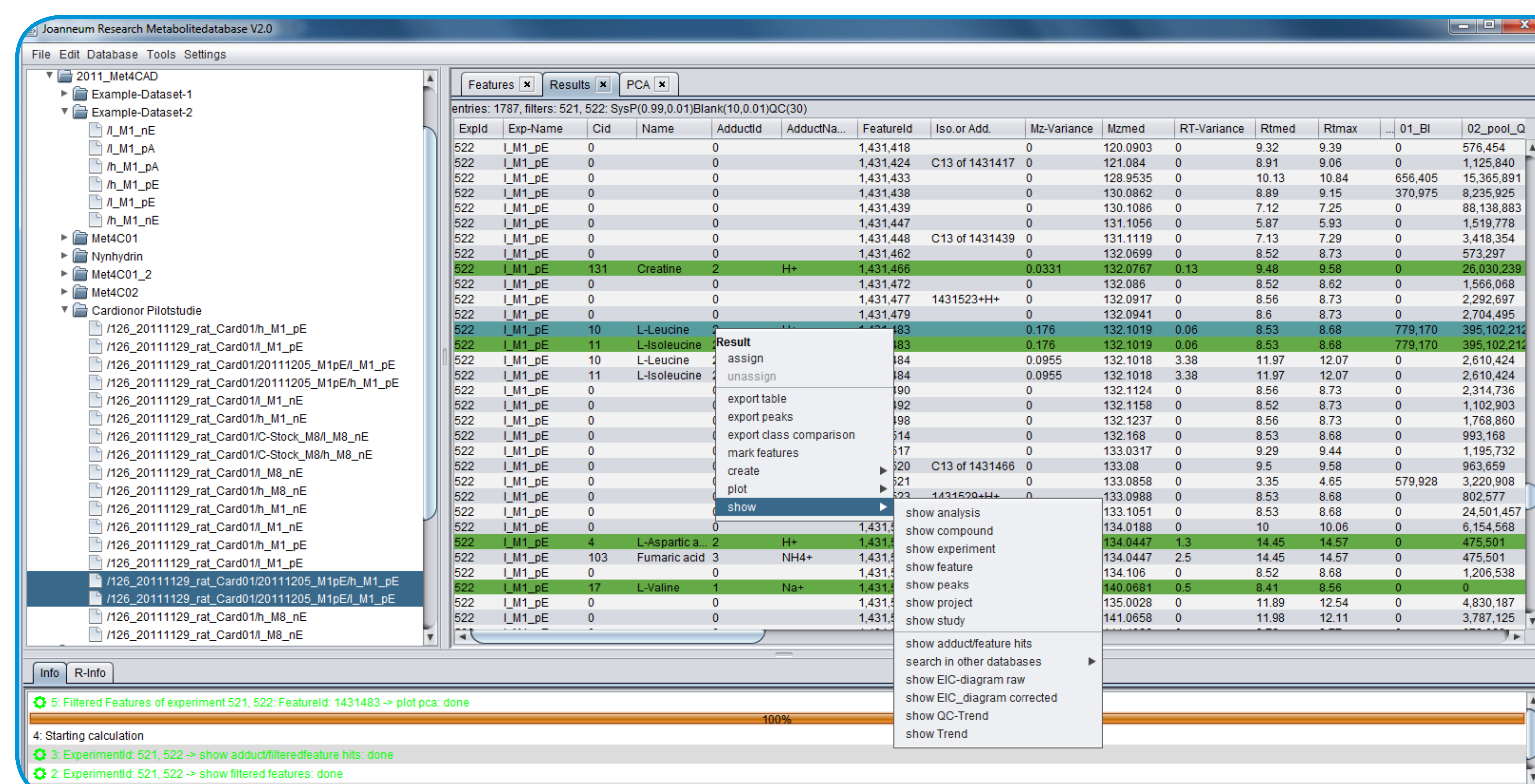


Figure 1: JRMDb with identified compounds. Green marked ones are within a specified retention time window. The popup-menu shows possible actions.

## Case Study

In order to challenge the software with a rather  
scientifically problem we compared typical inducers  
of autophagy in *Saccharomyces cerevisiae*. The aim  
was to identify key metabolites which distinguish  
induction of autophagy by chemical treatment  
(Rapamycin) and induction through nutrient starvation  
(Rapamycin) and induction through nutrient starvation  
(HBSS/SN-D/SD-N) (Fig. 4).

The workflow was as following:

- Sample extraction (n = 4 per sample group) using  
trichloroacetic acid
- QC-sample-preparation by mixing equal amounts of  
each sample in one vial
- Automated analysis-sequence-generation and sample  
randomization
- LC/FTMS measurement according to<sup>[7]</sup>
- Data conversion from vendor file format to mzXML
- Automated XCMS-preprocessing
- XCMS-processing detecting 1203 features
- Storing data to MySQL database
- Data filtration reducing the features to 631
- Compound-identification within the remaining features  
by m/z and retention time
- PCA-creation (Fig. 5)
- Creation of a heat map (Fig. 6)

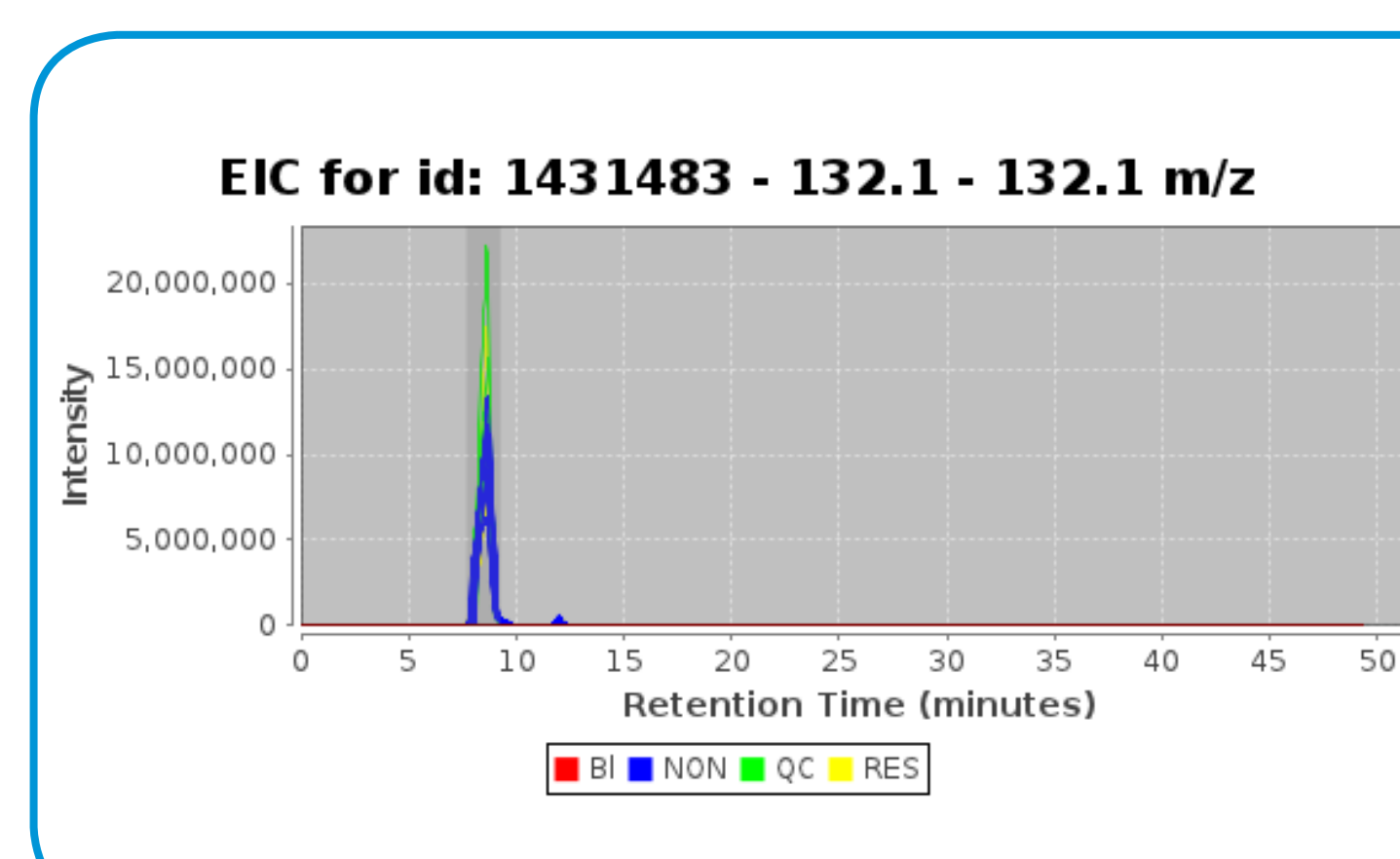


Figure 3: Extracted ion chromatogram. Samples belonging to the same class get automatically the same color.

## Conclusion

With JRMDb we have consolidated the metabolomic  
workflow from data conversion and processing as well as  
study management to statistical and visual interpretation  
of the metabolomics data within one program. Due to  
the modular design further tools like normalization and  
additional plots can be added easily.

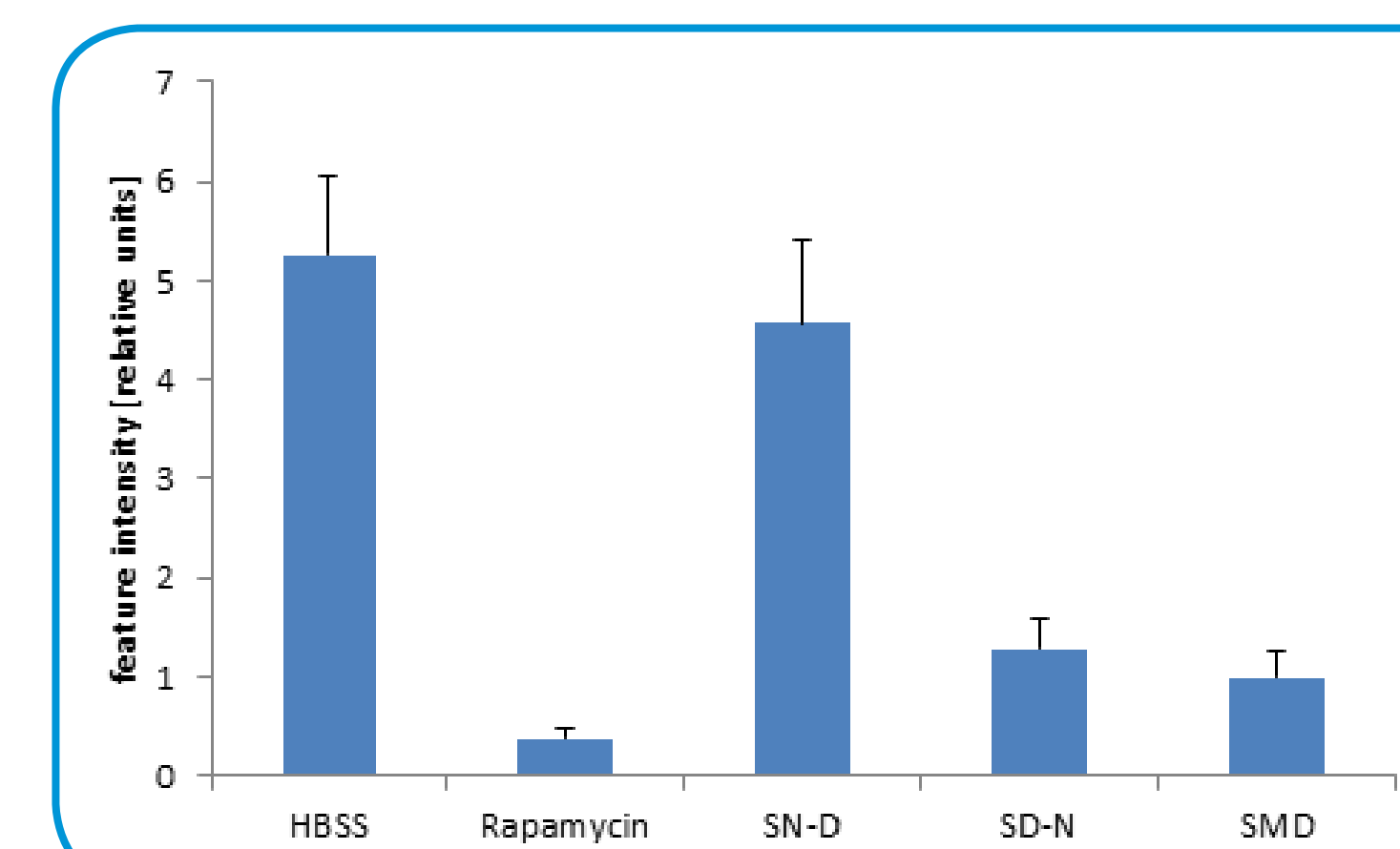


Figure 4: Content of adenosine-5'-triphosphate (ATP) of *saccharomyces cerevisiae* normalized on the amount of cells and relative to ATP content of cells grown in SMD (synthetic media containing dextrose) in different autophagy inducing growth conditions. HBSS (Hank's balanced salt solution) buffer containing 0,1 % glucose; SD-N synthetic media lacking a nitrogen source; SN-D synthetic media lacking dextrose; rapamycin SMD media containing rapamycin.

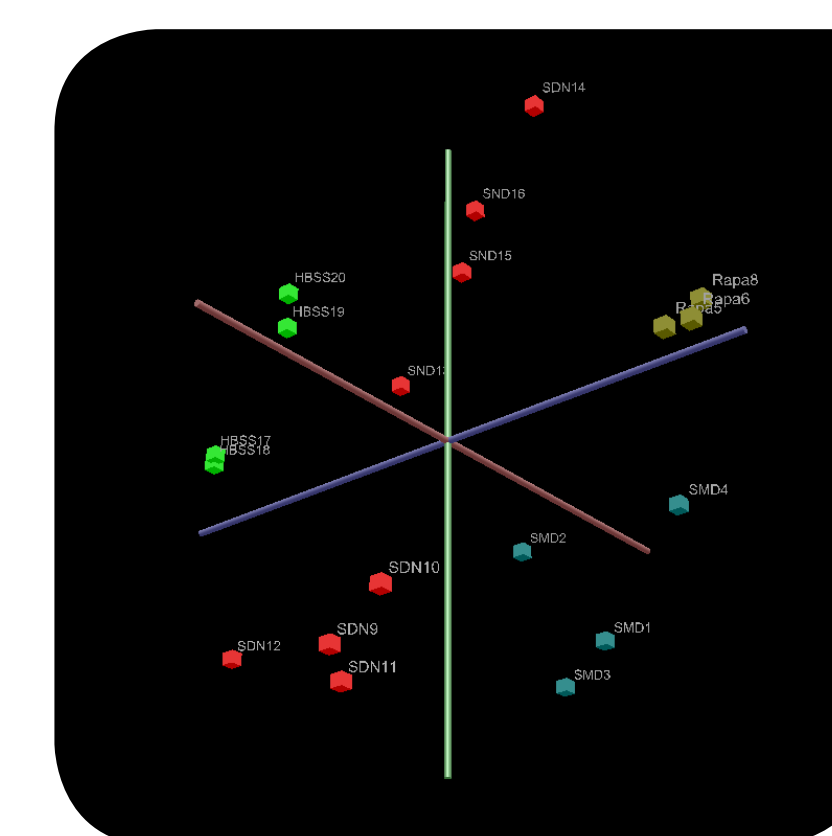


Figure 5:  
The 3D-PCA clearly clusters  
the treatment groups from the  
case study. See also (Fig. 4).



Figure 6:  
Shows a heat map generated  
by JRMDb. The intensities  
of every feature have been  
normalized to an average of  
0 and a standard deviation of  
1. Low intensities are  
represented by a green and  
high ones by a red color.