

# An untargeted metabolomics approach highlights short-term and long-term effects of bariatric surgery in humans

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## References

- [1]  
Smith, C. A.; Want, E. J.; O'Maille, G.; Abagyan, R.; Siuzdak, G. XCMS: processing mass spectrometry data for metabolite profiling using nonlinear peak alignment, matching, and identification. *Anal. Chem.* 2006, 78, 779–787.
- [2]  
Libiseller, G.; Dvorzak, M.; Kleb, U.; Gander, E.; Eisenberg, T.; Madeo, F.; Neumann, S.; Trausinger, G.; Sinner, F.; Pieber, T.; et al. IPO: a tool for automated optimization of XCMS parameters. *BMC Bioinformatics* 2015, 16, 1–10.

## Introduction

Bariatric surgery is currently considered one of the most effective treatments of obesity, leading to a recovery of the patient's metabolism. Besides the highly individual metabolic effects of bariatric surgery, the reduction of cardiovascular risks is an important aspect to be assessed. The aim of this study was to identify and quantify relevant metabolic changes which occur shortly after the surgery and after one year in a long term follow-up.

## Results

Metabolic feature selection resulted in 177 metabolic features that describe short-term and long-term effects and subsequently 36 metabolites were identified.

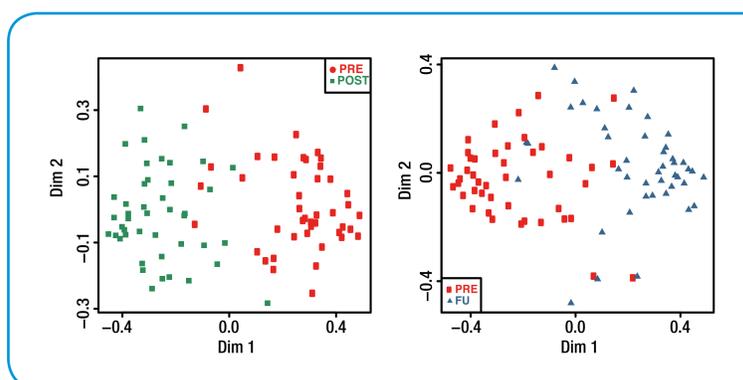


Figure 1: Multi-Dimensional-Scaling showing distinct clustering of plots from supervised Random Forests, showing clustering for samples taken before and after the surgery for both time-points.

8 metabolites were linked to cardiovascular risk: TMAO, indoxyl sulphate (increasing trend), choline, alanine, phenylalanine, tyrosine, valine, leucine/ isoleucine (decreasing trend).

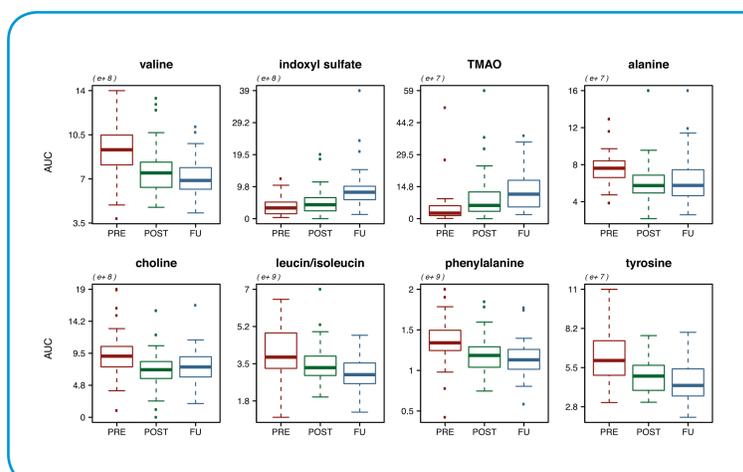


Figure 2: Changes in the intensities (peak-AUC) of identified metabolites before and after bariatric surgery

## Methods

LC-HRMS (HILIC-QExactive) was used to analyze 132 serum samples from 44 patients before surgery (PRE), after hospital discharge (POST) and at a 1 year follow-up (FU). The raw data was processed with open source R package XCMS, optimized by IPO(1,2) and normalized through quantile regression based on quality controls.

Combining Random Forests and paired-t-tests defined a process to select metabolic features that describe the changes between two time points. The same metabolic feature selection process was applied to compare time-point 1 and 2 (PRE-POST) as well as time-point 1 and 3 (PRE-FU). The intersection of the selected characteristic metabolic features from both comparisons represents the combined information of short- and long-term effects of bariatric surgery.

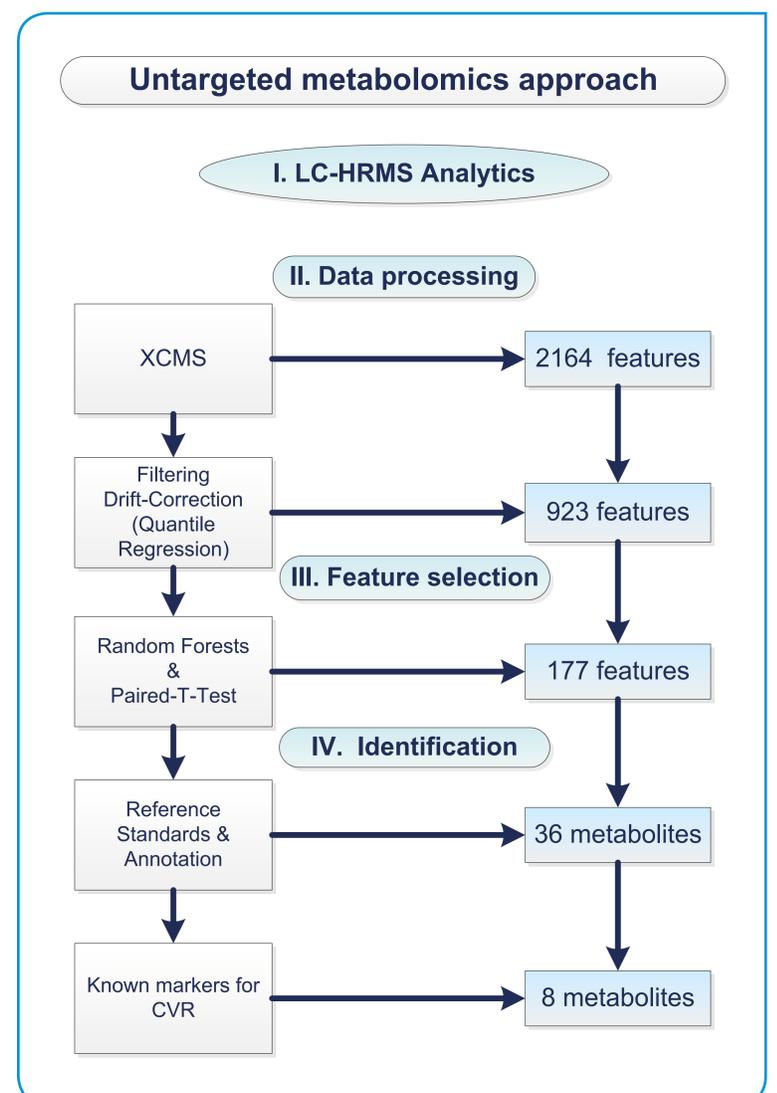


Figure 3: Scheme of untargeted metabolomics approach (CVR=cardiovascular risk)

## Conclusion

The identified metabolites showed different trend-patterns over time, highlighting the importance of short and long-term metabolomics assessment after bariatric surgery. For the development of potential prognostic markers, metabolites with a negative or a positive median trend are better suited for further investigations rather than metabolites with an alternating zigzag course. This study links short-term and long-term metabolic changes after bariatric surgery by using an untargeted metabolomics approach.