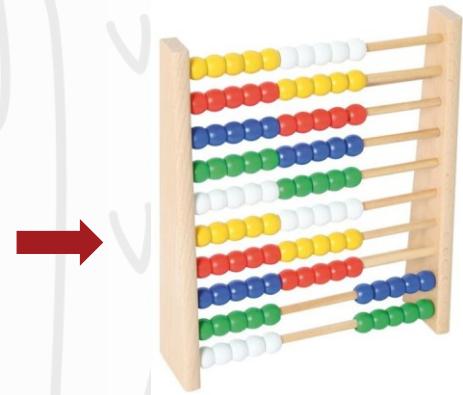
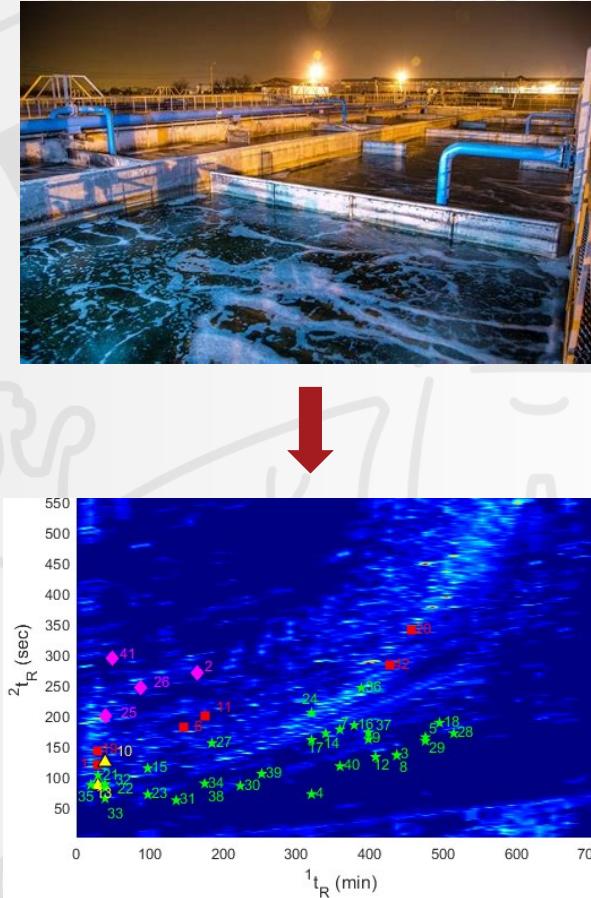
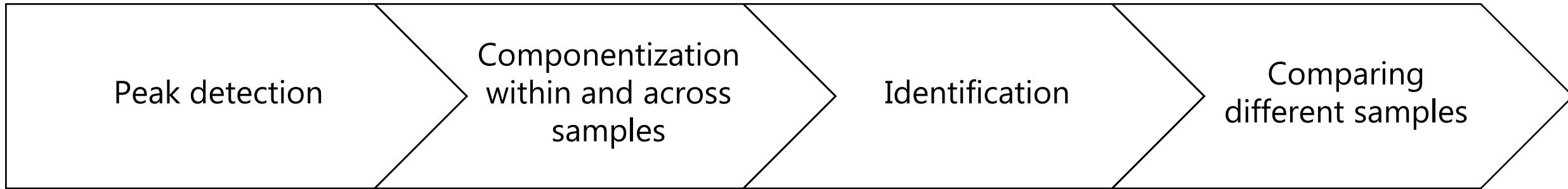


# DATA PROCESSING WORKFLOWS FOR NON-TARGET SCREENING ON LC $\times$ LC-HRMS DATA: READY TO GO?

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# Overview of non-target screening workflow



Risk of loosing relevant information

Data size

## Challenges

- Low intensity compounds
- Slow processing

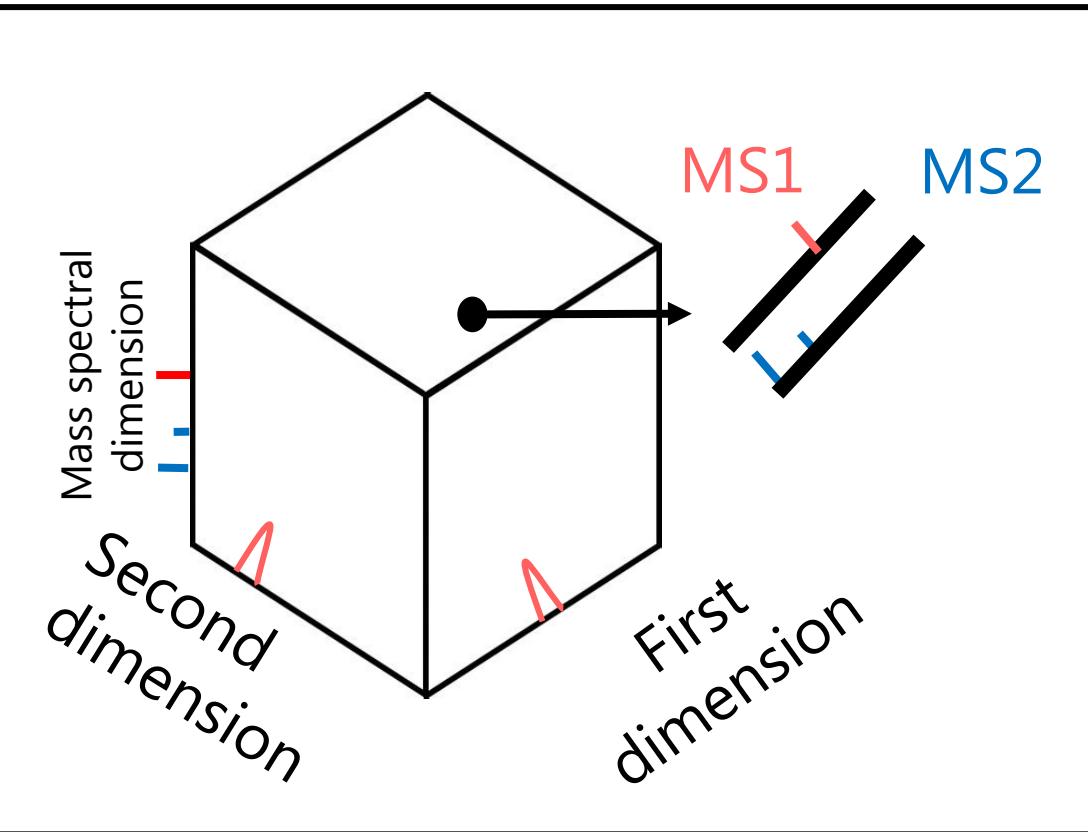
- Poor grouping of  $m/z$

- Non-diagnostic ions in mass spectrum

# Data structure of LC×LC-HRMS in data independent mode

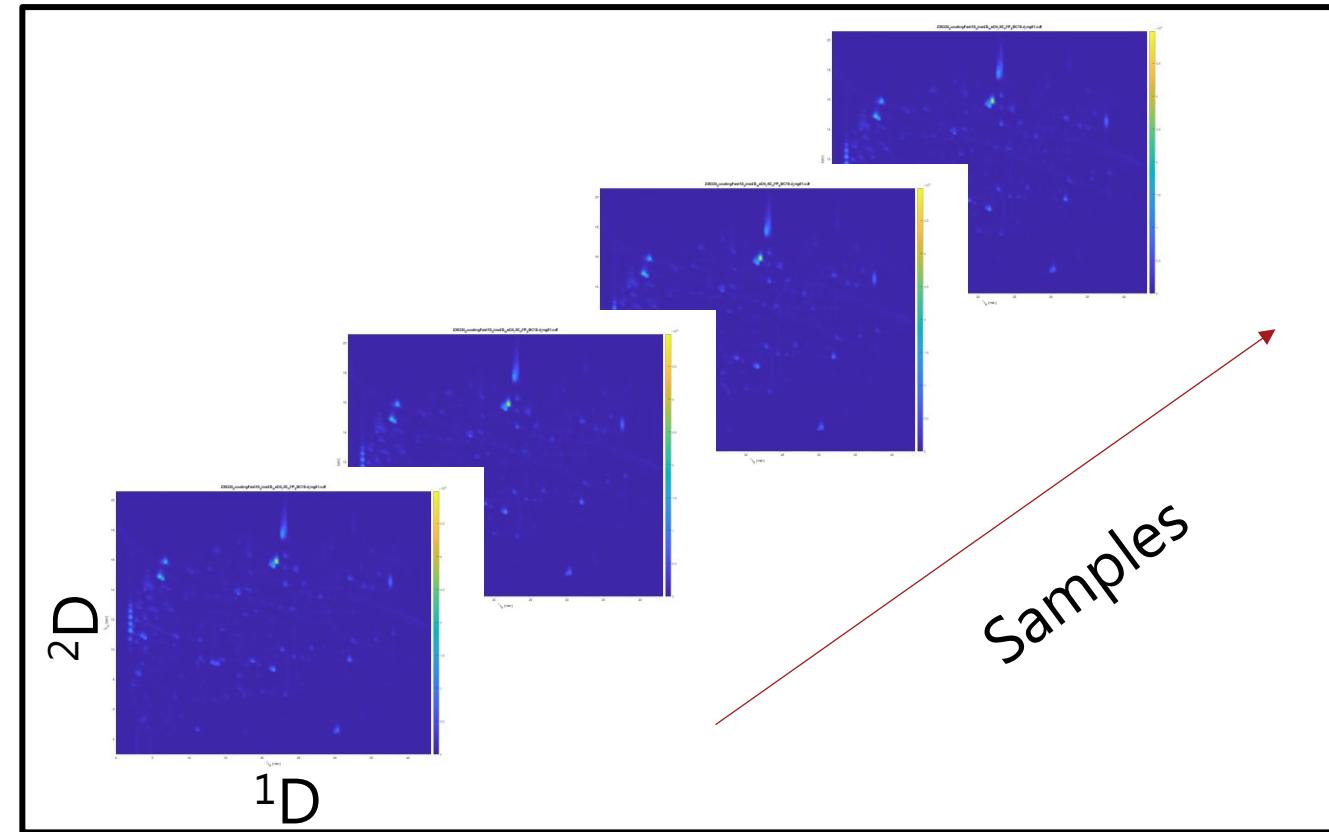
## Single sample

Data size: 5-7 GB



## Multiple samples

Data size: too large for normal computers!



# We need to:

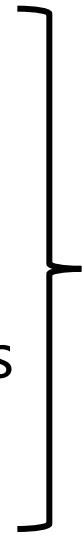
1. Compress the data without loosing information

**Methods: Region of Interest**

2. Extract high-quality mass spectra of trace-level compounds

**Methods: mass filtering, multivariate curve-resolution**

3. Group compounds across samples

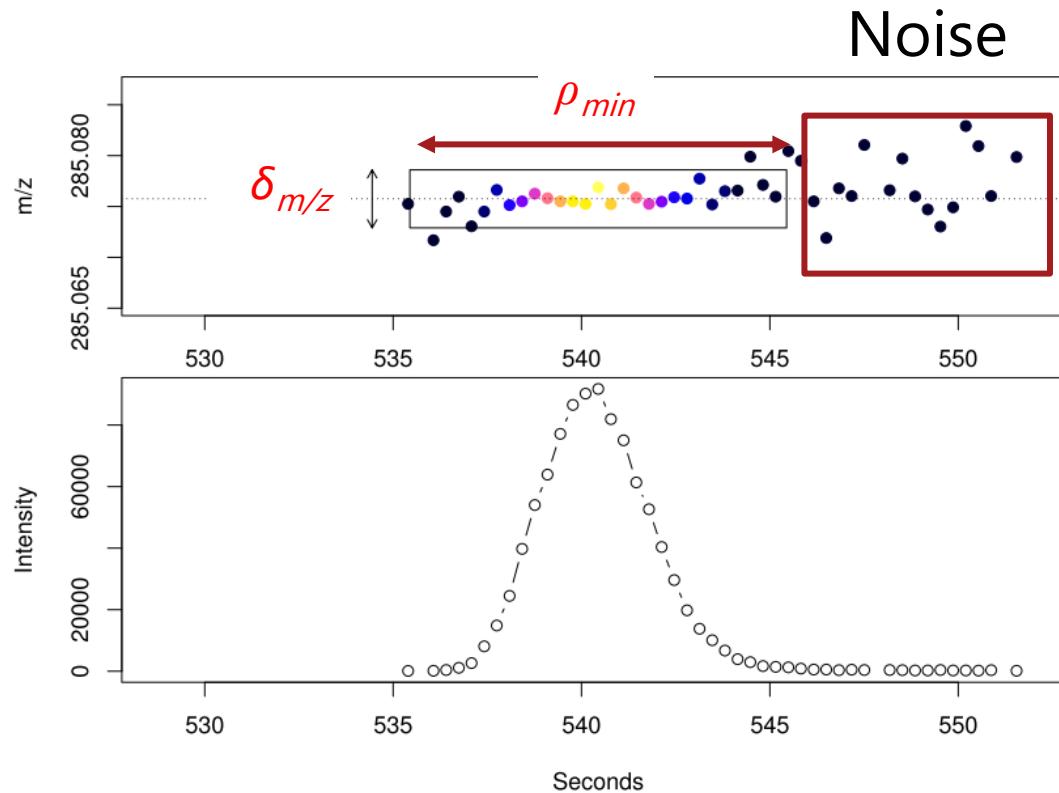


Focus of today

# Region of interest yields high mass accuracy and high data compression

## Input parameters

- m/z deviation ( $\delta_{m/z}$ )
- Minimum peak width ( $\rho_{min}$ )



Tautenhahn et al., BMC Bioinformatics 2008, 9:504 (2008)

## Optimization

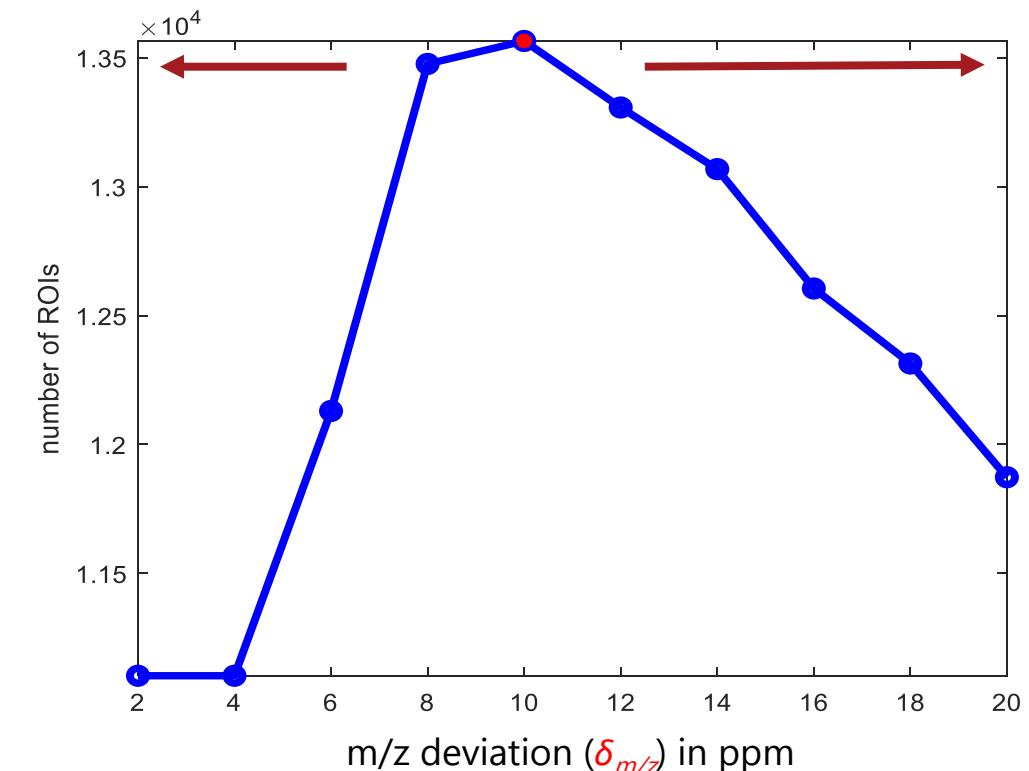
### m/z deviation ( $\delta_{m/z}$ )

#### Low $\delta_{m/z}$

Split ROIs

#### High $\delta_{m/z}$

Loss of resolution

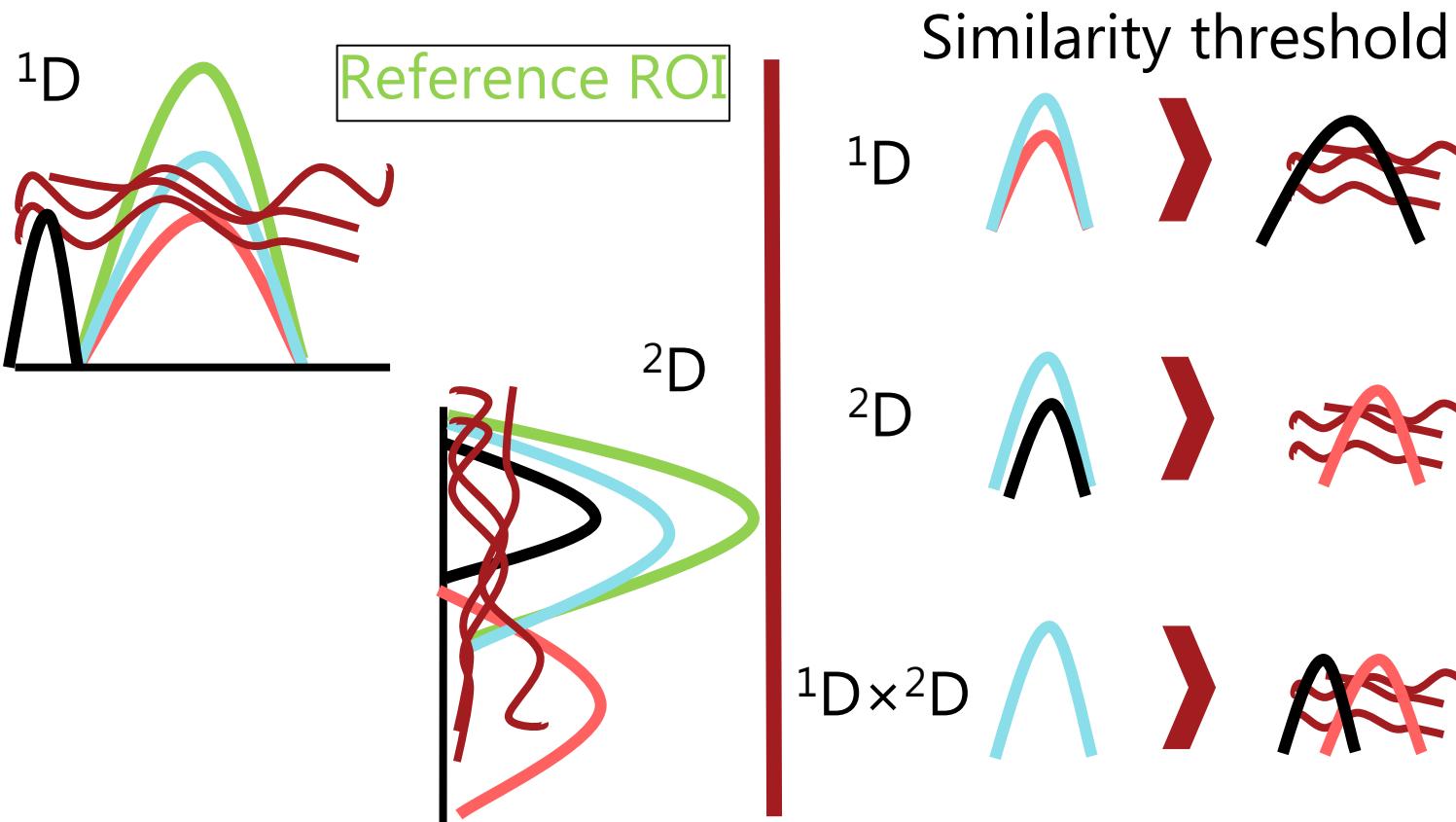


Kronik et al., Analytical and Bioanalytical Chemistry (2025)

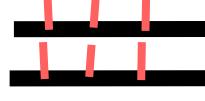
# Leveraging the two-dimensional data through mass filtering reduces data complexity

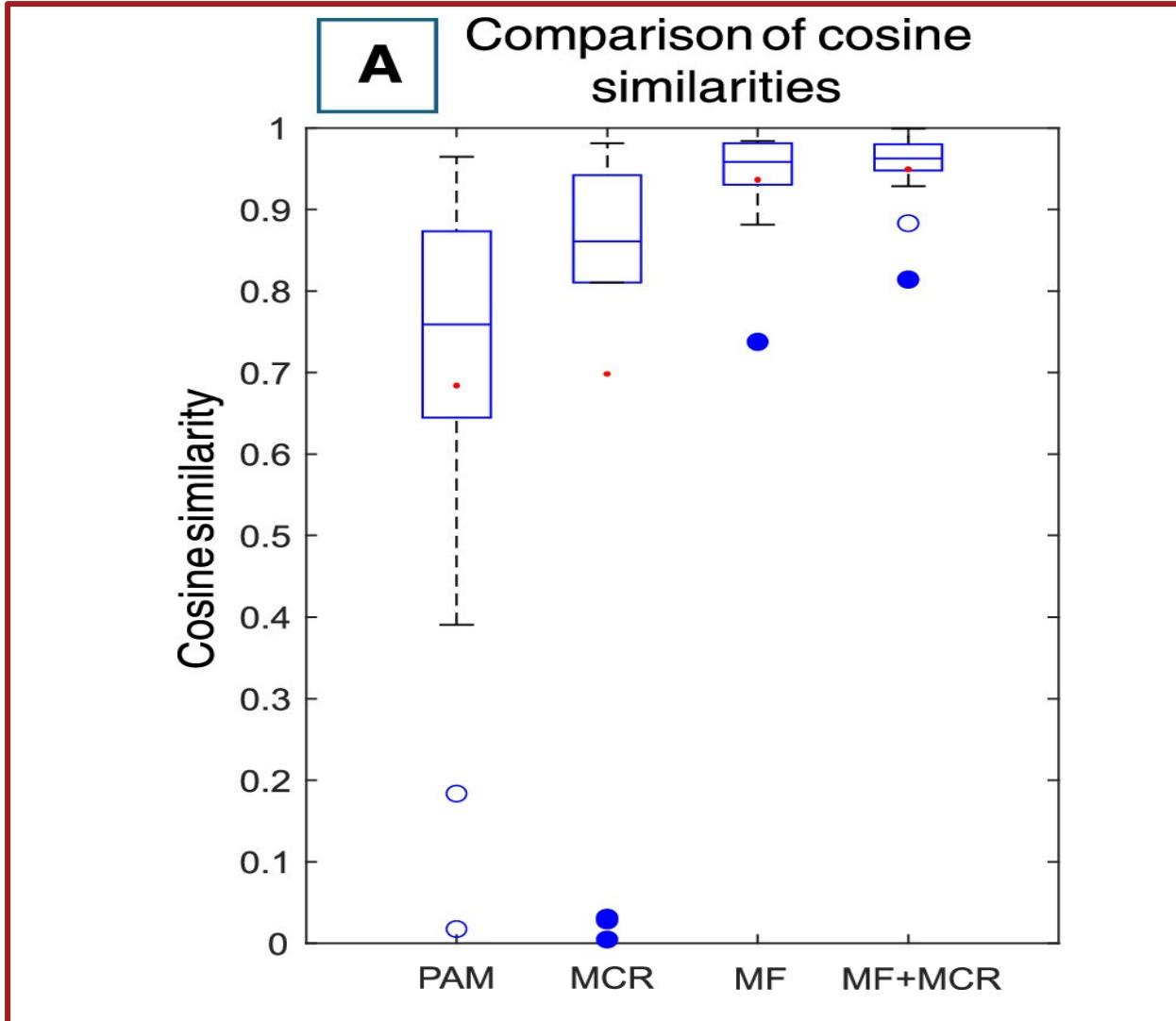
Mass filtering:  
Similarity between ROIs in the  $^1\text{D}$  and  $^2\text{D}$

Relevant ROIs after mass filtering



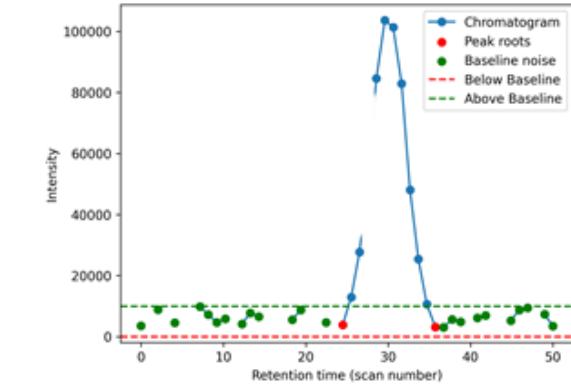
# The mass spectral quality improves with mass filtering and multivariate curve-resolution (MF+MCR)

- The **cosine similarity** is a measure of similarity between two vectors
- 0 = no similarity = 
- 1 = identical = 
- The cosine similarity was highest for the MF+MCR workflow when comparing towards a reference spectrum

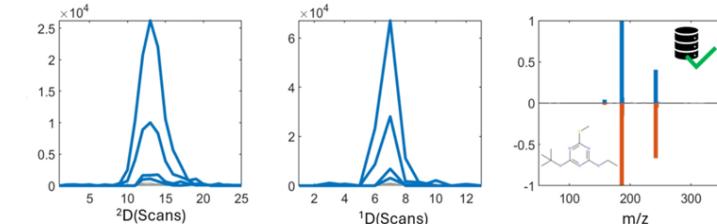


# Conclusion

- High data compression rates achieved using ROI
- Allowing for processing of multiple samples at the same time
- Fewer challenges with exceeding the computer's RAM



- Leveraging the data structure improved mass spectral quality for HRMS data obtained in data independent acquisition. Therefore, the number of identifiable compounds increased.



- Future work includes:
  - Validating workflows across diverse datasets to ensure robustness
  - Comparing across samples

# Acknowledgements

- The organizing committee
- The VANDALF team involved in acquiring the samples
- The work was funded by:
  - **Innovation Fund Denmark** project VANDALF, Grant Number: 9067-00032A,
  - **Novo Nordisk Foundation** project The Matrix (Grant number: NNF19SA0059348).

## Code availability:

Region of interest: <https://github.com/OskarMunkKronik/regionofinterest>

Mass filtering: <https://github.com/PaulAlbertAnselm/MassFiltering>

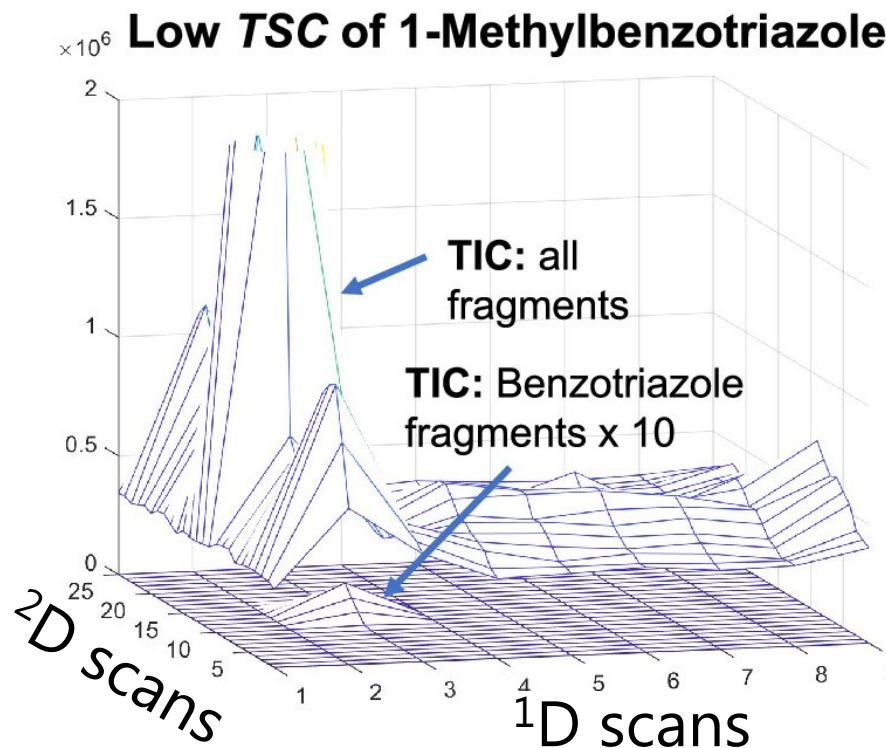
## Check out

Wednesday 2:00 – 2:10: FL22 Nadine Gawlitta - Ambient ultrafine particles: classification, chemical characterization, and quantification of ubiquitous PAHs via DTD-GC $\times$ GC-TOFMS

# Extra slides

# The MF+MCR enables identification of trace-level compounds in municipality wastewater

Relevant pollutants in wastewater effluent can have low intensity

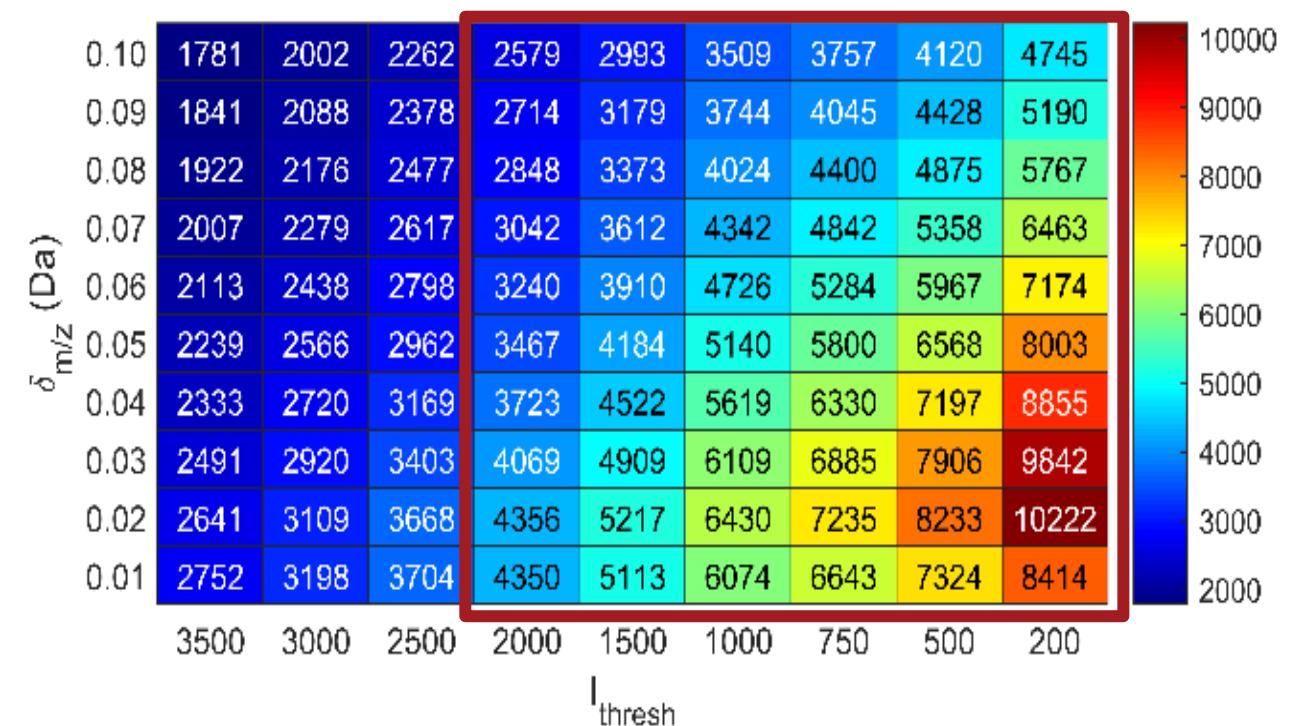


Peak apex method (PAM),

Compound name	TSC	Detected suspects	
		PAM	MF
Fexofenadine	0.0608	1	0
Lamotrigine	0.0441	1	0
Losartan carboxylic acid	0.0190	1	0
Citalopram	0.0165	1	0
Metoprolol	0.0124	1	0
2-[4-(Diethylamino)-2-hydroxybenzoyl]benzoic acid	0.0116	1	0
Galaxolidone	0.0096	0	1
Amisulpride	0.0073	0	1
DEET	0.0068	1	0
2-Ethylidene-1,5-dimethyl-3,3-diphenylpyrrolidine	0.0061	0	1
Ensulizole	0.0061	1	0
Methadone	0.0048	0	1
Amitriptyline	0.0047	0	1
Cetirizine	0.0030	0	1
Diclofenac	0.0022	0	1
Losartan carboxaldehyde	0.0014	0	1
Carbamazepine	0.0013	1	0
Gabapentin lactam	0.0011	1	0
Terbutryn	0.0011	0	1
Clopidogrel carboxylic acid	0.0010	0	1
Verapamil metabolite	0.0007	0	1
Venlafaxine	0.0005	0	1
Climbazole	0.0004	0	1
1-Methylbenzotriazole	0.0004	0	1
Ritalinic acid	0.0004	0	1

# Optimization scheme to preserve the mass spectral resolution

## Optimization



The compounds detected in each sample can be grouped across samples

