

# Automatic metabolite annotation in complex LC-MS<sup>(n ≥ 2)</sup> data using MAGMa

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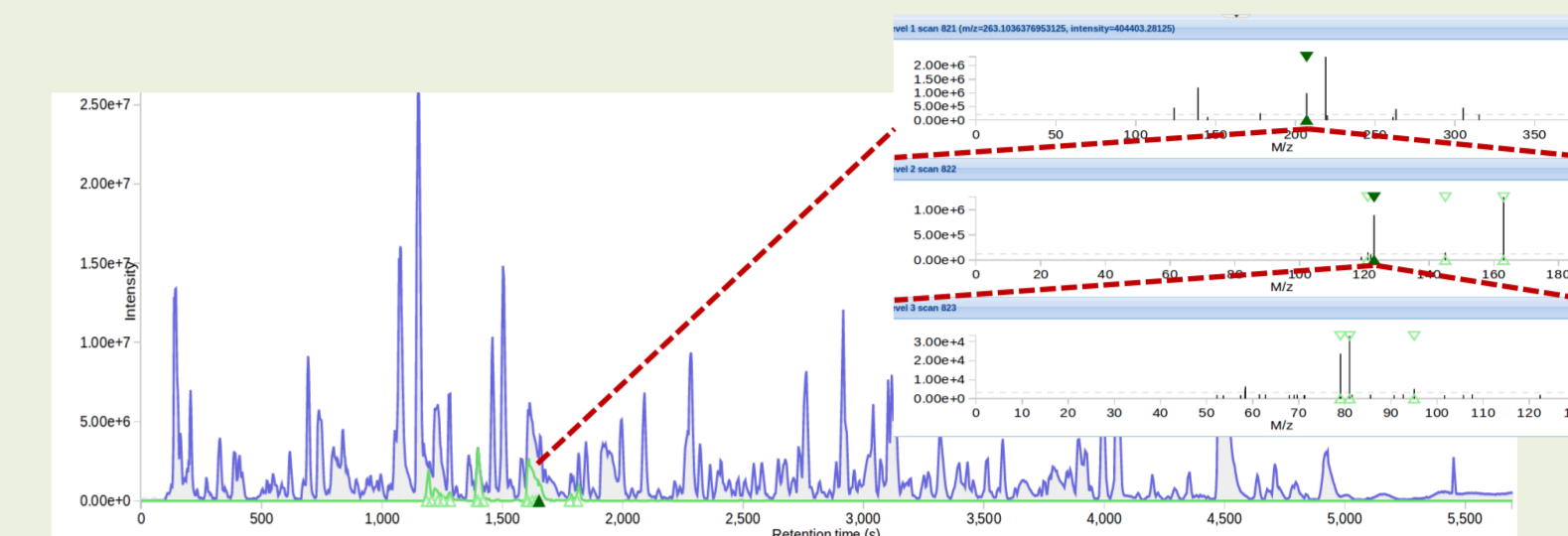
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## Problem

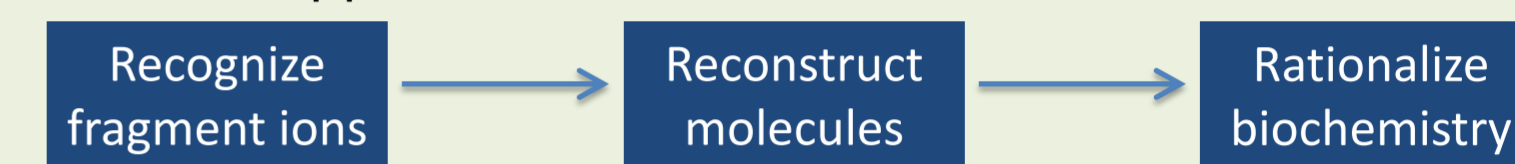
- The manual annotation of unknown compounds in complex LC-MS<sup>n</sup> datasets is time-consuming and requires specific knowledge of the detected compound classes and their fragmentation patterns in the mass spectrometer.

## Objective: develop algorithms and tools (MAGMa) to

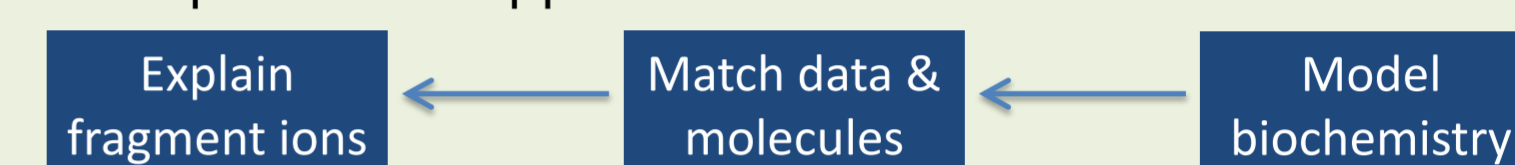
- automatically interpret multistage MS<sup>n</sup> spectral trees based on substructures of candidate molecules
- systematically process untargeted LC-MS<sup>n</sup> datasets for comprehensive compound annotation
- predict candidate molecules not present in chemical databases



Manual approach



Computational approach



## Methods

- Recursively split molecules by removing atoms
- Bitwise representation of substructures (fast processing)
- Substructure penalty score depends on disconnected bonds:

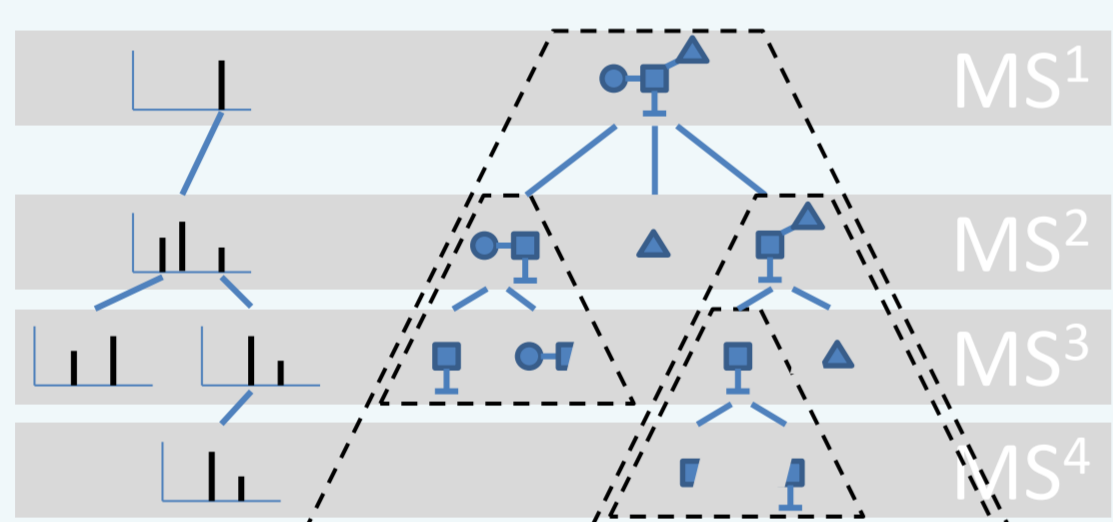
$$\text{Substructure score} = \sum_{b \in \text{disconnected bonds}} h_b p_b$$

Bond type	Value
Single bond	p=1
Double bond	p=2
Triple or aromatic bond	p=3
Carbon-carbon bonds	h=2
Bonds involving non-carbon atoms	h=1

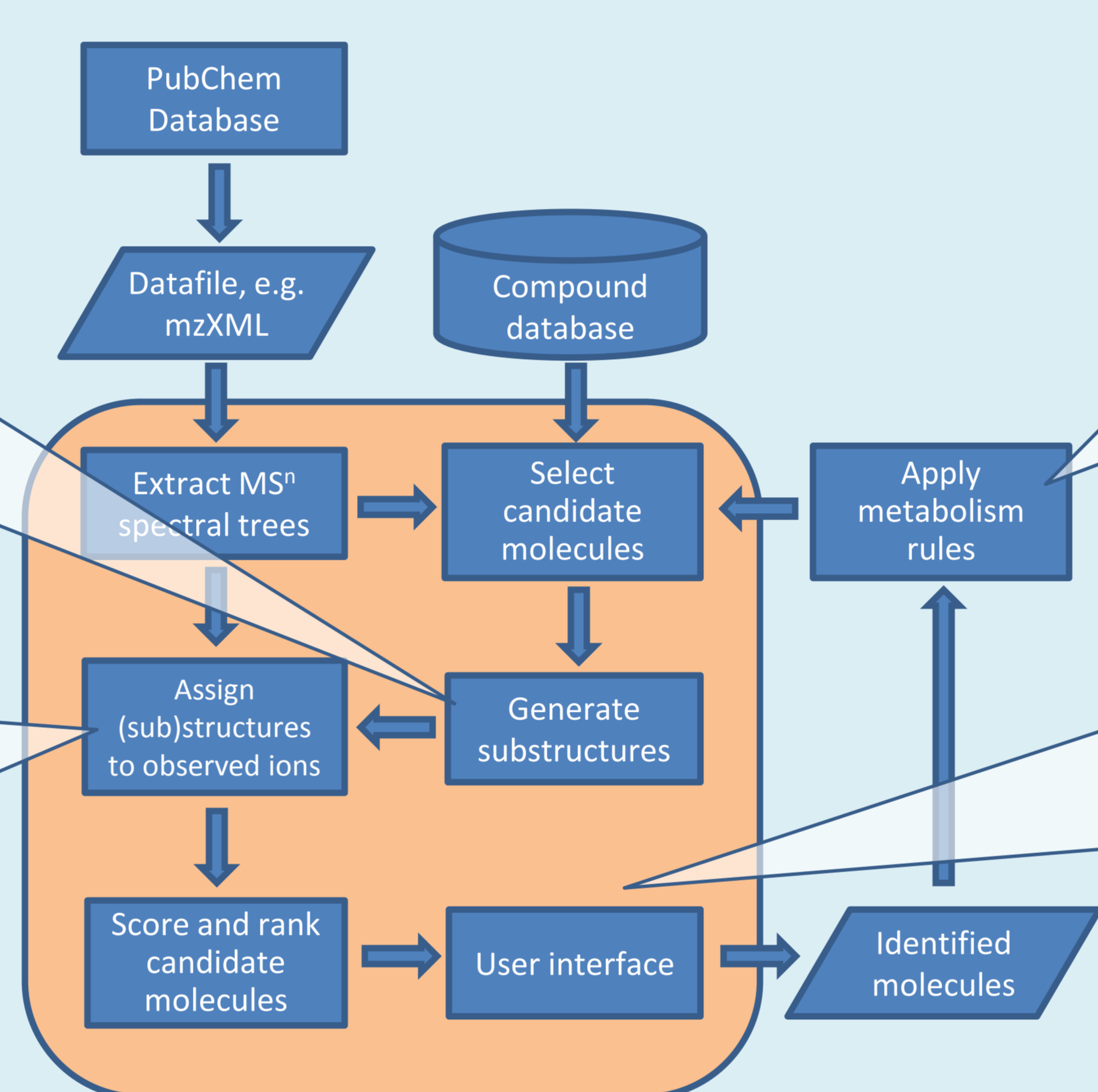
- Example: buspirone substructures versus expert (literature)
- Rearrangements are not included

m/z	Assigned substructure	score	Literature
122.0712		2	
150.1024		2	
152.1067		3	
222.1479		1	

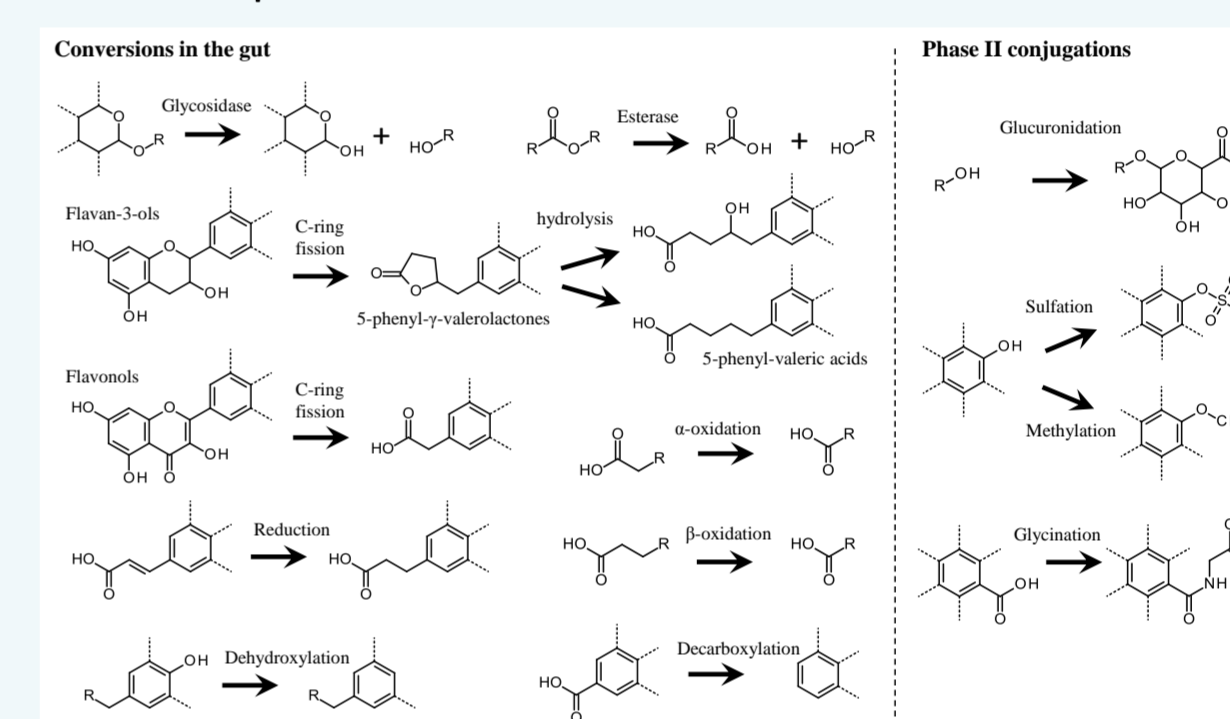
- Recursive algorithm matches multistage MS<sup>n</sup> data with hierarchical trees of *in silico* generated substructures
- Substructure assignments at each MS level take the assignments of the precursor as well as subsequent fragmentations into account
- Total score is  $\sqrt{\text{intensity}}$  weighted average of substructure scores



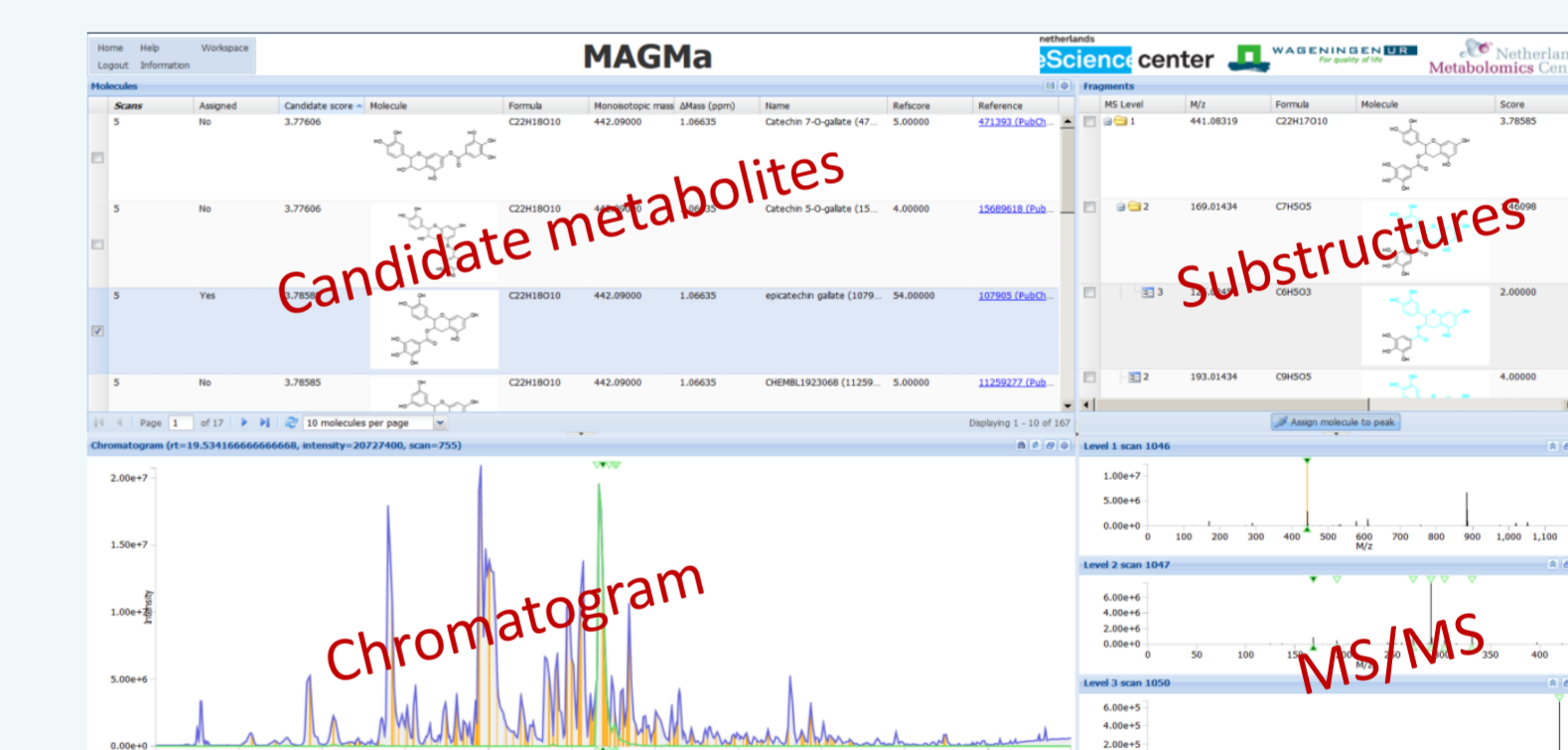
## Schematic overview of MAGMa



- In silico* reaction rules for gut metabolism and human phase I and II biotransformations are encoded as SMIRKS
- Rules are applied following a multistage "scenario" involving different types of subsequent metabolism



- Four interactive panels: candidates, chromatogram, MS<sup>n</sup> spectra and substructures:
- Select a scan and a candidate to show the fragment annotation



## Evaluation of candidate ranking

- MS/MS of 100 drugs, ramp 10-50 eV
- On average 248 candidates per dataset

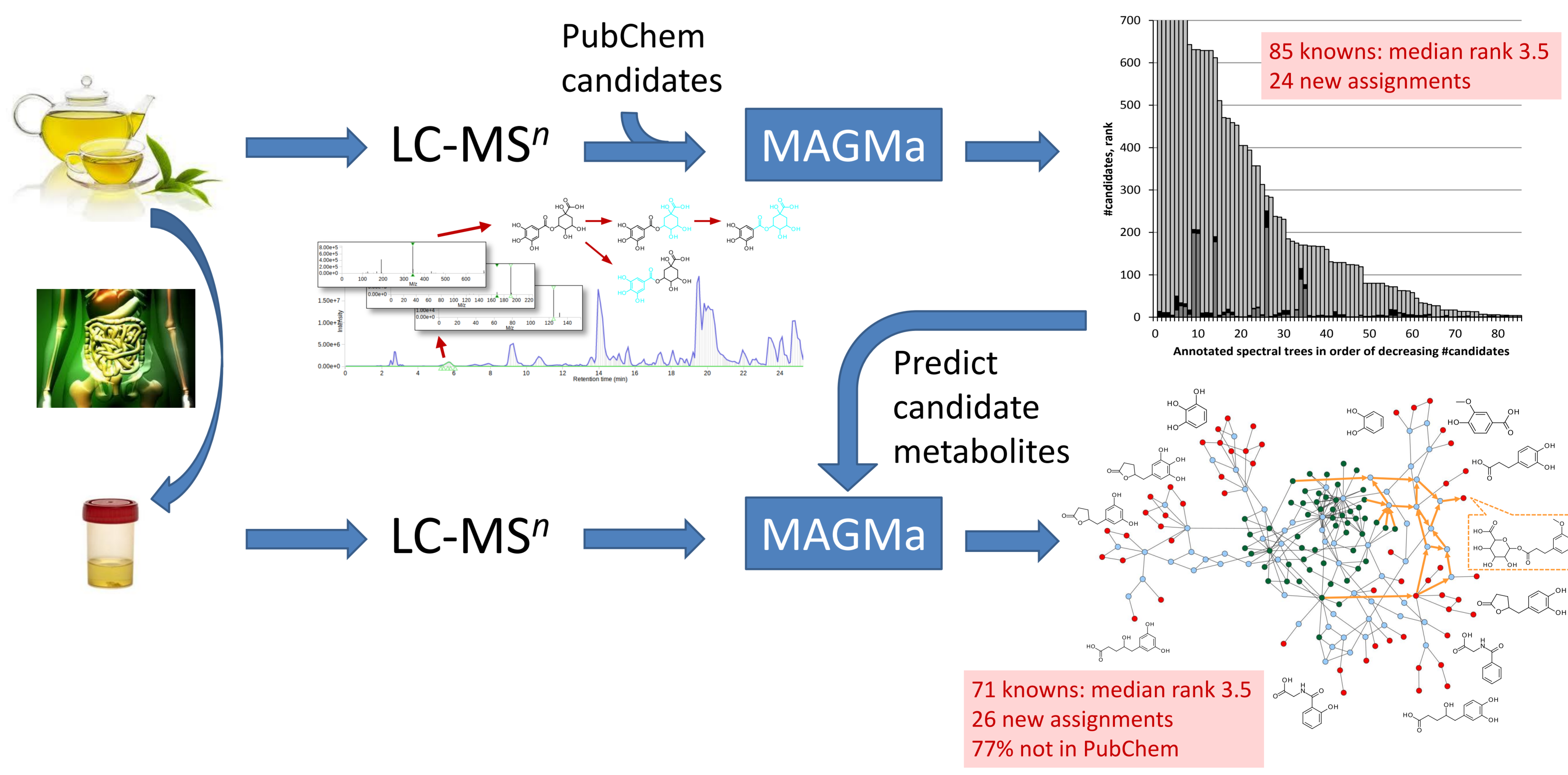
ranking statistics	selected spectra		merged spectra	
	median rank	3rd quartile rank	median rank	3rd quartile rank
MAGMa, NBD = 2	4	35	4	17
MAGMa, NBD = 3	3	17.5	3	11
MAGMa, NBD = 4	3	14.5	3	9
Hill et al. <sup>b</sup>	4 <sup>a</sup>	17.5 <sup>a</sup>		
MetFrag <sup>a</sup>			4.5 <sup>a</sup>	11.75 <sup>a</sup>

<sup>a</sup> Wolf et al. *BMC Bioinformatics* 2010, 11, 148. <sup>b</sup> Hill et al. *Anal. Chem* 2008, 80, 5574

#	Compound	# candidates	rank
1	Feruloyl tyramine	1084 <sup>a</sup>	1
2	Feruloyl putrescine	631 <sup>a</sup>	3
3	N2-Acetyl glutaminy leucinamide	370	17
4	Dihydrochalcone	825	78
5	Isoprothiolane	350	2
6	Phosphatidyl-6-acetyl-glucose	7	1
7	Cinnamtannin A3	17	1
8	Prodelpinidin C2	1	1
9	Chlorpyrifos	113	1
10	VAL-HIS-LEU-THR-PRO-VAL-GLU-LYS	20	1
11	Demethoxycurcumin	906 <sup>a,b</sup>	6
11	Demethoxycurcumin (tautomer 1)	906 <sup>a,b</sup>	4
12	Baicalein	813 <sup>a</sup>	271
13	EST; Aloxiastatin	207	42
14	Tetrahydroalstonine	1583 <sup>a</sup>	5
15	2-(Perfluorooctyl)ethanol	720 <sup>a</sup>	2
16	Ofloxacin	998 <sup>a,b</sup>	18

<sup>a</sup> Candidates were filter by refscore > 5.  
<sup>b</sup> MAGMa results generated retrospectively.

## Application: urinary metabolites of compounds in green tea



## Conclusions

- MAGMa successfully prioritizes correct candidate molecules based on (multistage) MS<sup>n</sup> spectral data, and automatically assigns relevant substructures to multiple levels of MS fragments.
- Application to untargeted LC-MS<sup>n</sup> profile of green tea assisted putative identification of new compounds.
- The combination with *in silico* biotransformation lead to annotation of novel urinary metabolites.
- MAGMa makes chemical interpretation of LC-MS<sup>n</sup> data more systematic and faster.

## References

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- Ridder et al. *Rapid Commun. Mass Spectrom.* 2012, 26, 2461.
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- Ridder et al. *Anal. Chem.* 2014, DOI: 10.1021/ac403875b