

Development of a LC-HRMS workflow for the target, suspect and non-target screening of contaminants of emerging concern in environmental water samples



Nikolaos S. Thomaidis

Laboratory of Analytical Chemistry  
Department of Chemistry  
University of Athens

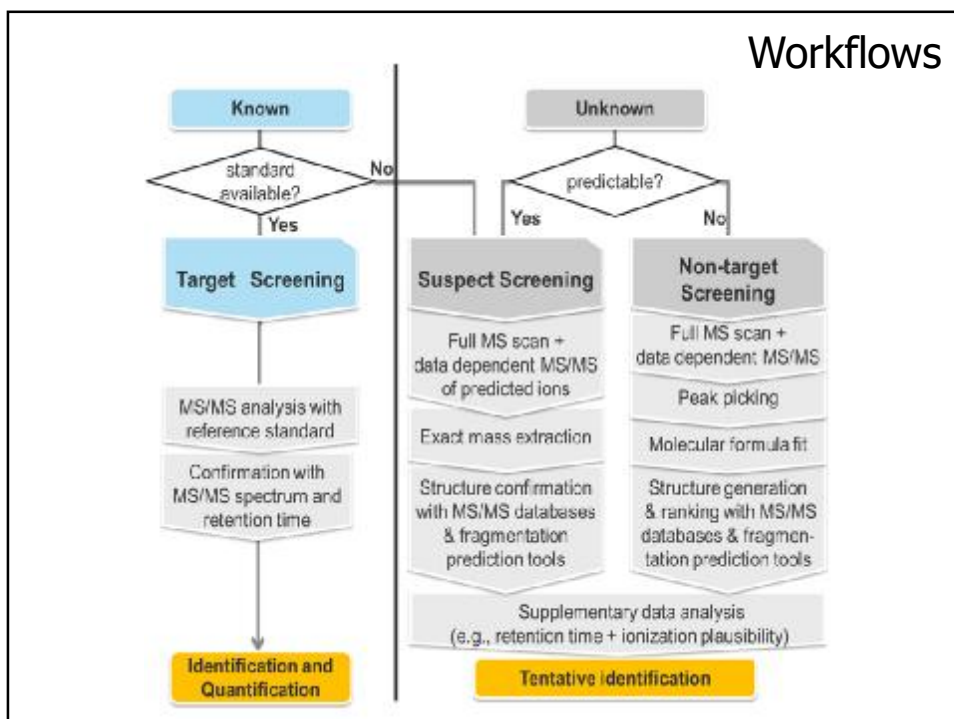
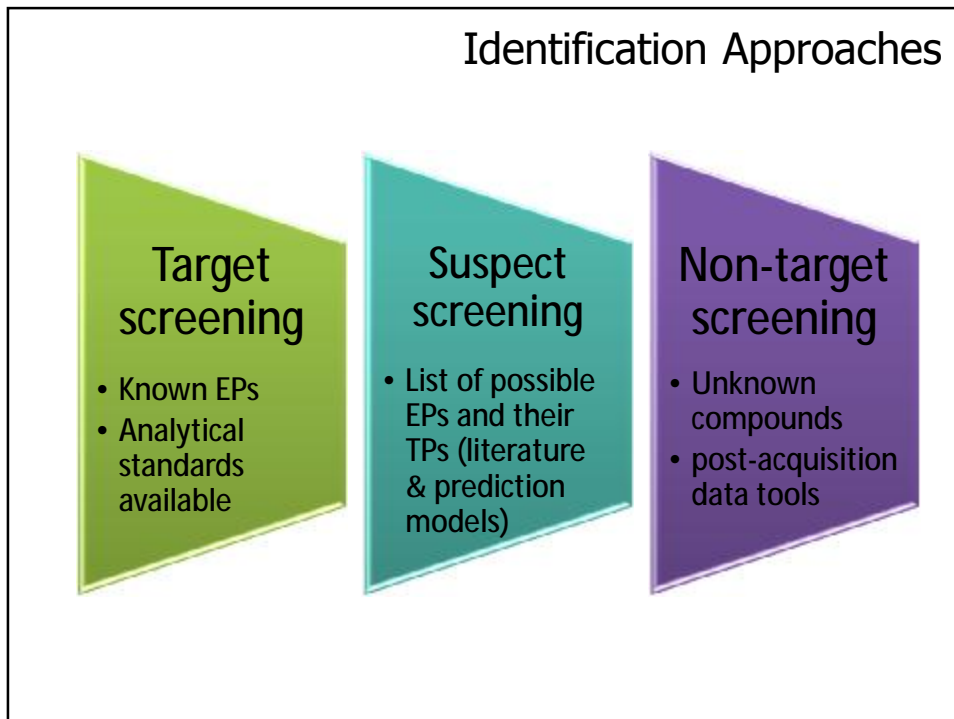


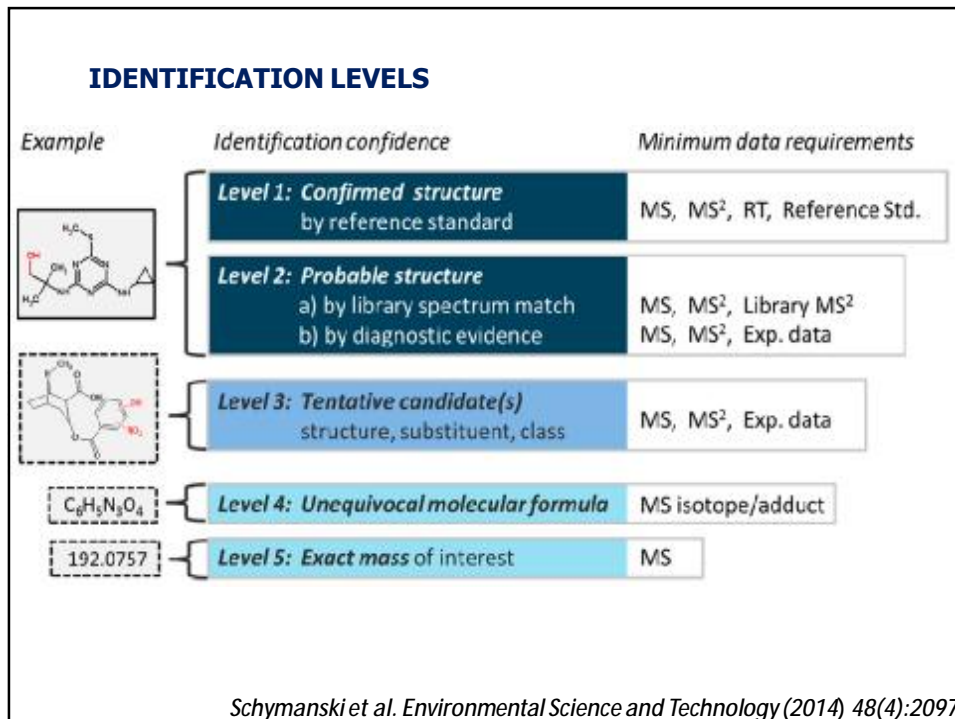
Emerging pollutants (EPs)

- Pharmaceuticals
- Illicit drugs
- Personal care products
- Endocrine disruptive compounds (EDCs)
- Flame retardants
- Food additives
- Disinfection by-products
- Pesticides
- +  
Metabolites & Transformation Products (TPs)



aquatic environment





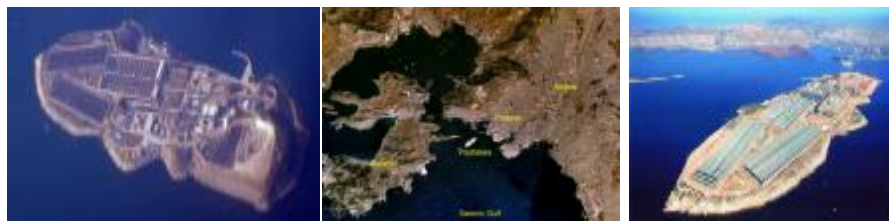
## Sampling

Location: WWTP of Athens, Greece

Period: March 2014

Samples:

- *24-h composite* flow-proportional samples of influent wastewaters & effluent wastewaters over a week (7 consecutive days)
- *2-h composite* flow-proportional samples of influent wastewaters (Thursday & Saturday, 12 samples per day, from 02:00 to 00:00)



## Sample Preparation - Analysis

- 200 mL filtered wastewater (pH adjusted to 6.5)
- Isotopically labelled internal standards were added (100 ng/L)
- Mixed SPE with 4 sorbents:  
(Strata X copolymer, Strata-X-AW, Strata-X-CW, IsoluteENV+)
- Extraction: Neutral, Basic & Acidic Compounds
- Evaporation/reconstitution to a final volume of 200 µL

HPLC-HRMS  
-QTOF-MS/MS

MS & MS/MS data  
in a single run

Target & Suspect  
Analysis:  
bbCID

Non-target screening:  
AutoMS/MS



## I. Target Screening

in-house database:

1500 compounds  
for positive ESI  
screening

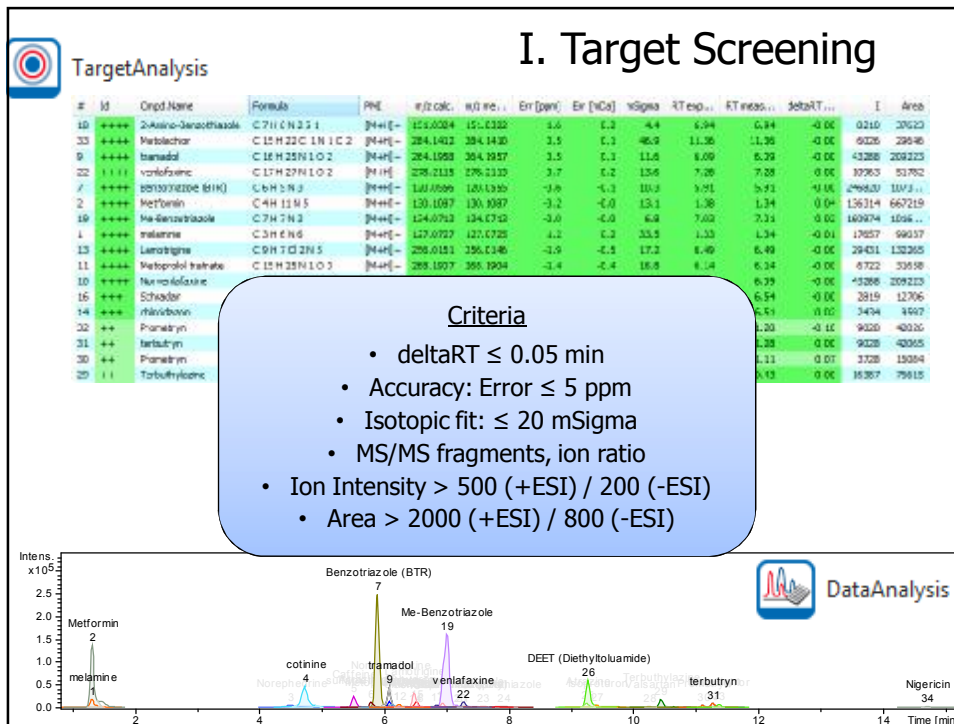
500 compounds  
for negative ESI  
target screening

- *more* than 700 pesticides
- *more* than 800 EPs & TPs

~200 common compounds

...including information over:

A	B	C	D	E	F	G	H	I	J	K	L	M	N	O
1	ca1 (P03)	RT P03	Acetylcholinesterase	name	COE	comment	comment	relative	retention	individual	radius	CF1	CF2	CF3
2	184.021798	3.09	C8H10NO3P8	Acetylcholinesterase	[8099-19-3]							342.0909		
3	142.912177	3.09	C24H27N5O5+	Acetylcholinesterase	[8099-19-3]							34.9995	139.9804	124.9631
4	279.125531	11.94	C14H15ClN2O2	Acetylcholinesterase	[14258-82-1]							224.0937		
5	224.083662	11.48	C12H15ClN2O2+	Acetylcholinesterase	[14258-82-1]							346.0121	113.0868	224.0937
6	379.03031	30.23	C14H15ClN2O2+	Acetylcholinesterase	[14258-82-1]									
7	265.013465	11.98	C12H15ClN2O2	Acetylcholinesterase	[14258-82-1]									
8	387.014591	11.98	C12H15ClN2O2+	Acetylcholinesterase	[14258-82-1]									
9	186.081257	11.26	C12H15ClN2O2+	Acetylcholinesterase	[14258-82-1]									
10	279.125531	11.4	C14H15ClN2O2	Acetylcholinesterase	[14258-82-1]									
11	162.027259	11.4	C11H15N3+	Acetylcholinesterase	[14258-82-1]									
12	238.0991181	11.4	C11H15ClN2O2+	Acetylcholinesterase	[14258-82-1]									
13	196.084740	7.16	C7H14N2O2S	Aldicarb	[116-06-2]									
14	208.114239	7.16	C7H14N2O2S+	Aldicarb	[116-06-2]									
15	118.052686	7.16	C5H10N2+	Aldicarb	[116-06-2]									
16	88.011936	7.16	C4H8N2+	Aldicarb	[116-06-2]									



## Results

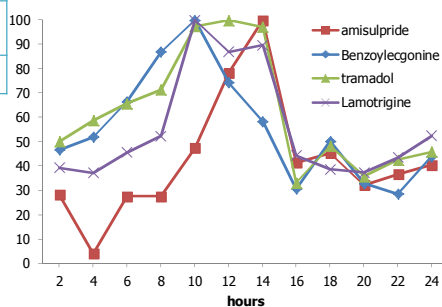
### I. Target Screening

Sat. 15/03/14  
24-h composite wastewater

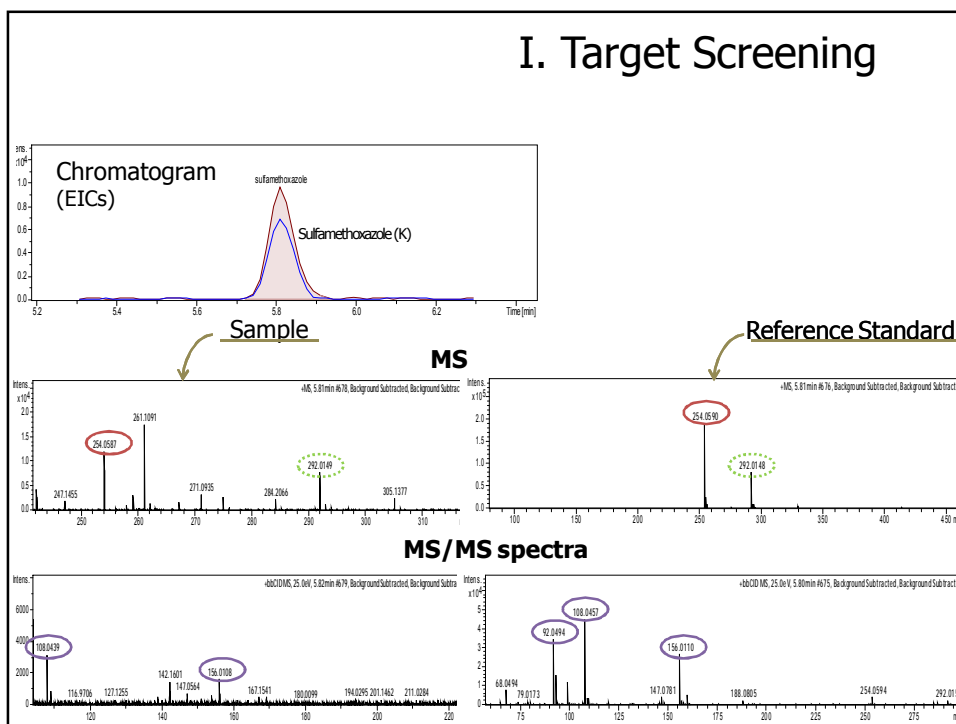
effluent	Compounds detected	influent
123	Compounds detected	176
75	pharmaceuticals & drugs of abuse	103
23	pesticides	39
6	PFCs	6
4	sweeteners	4
10	Disinfection by-products & PCP	19
5	Aminoacids	5

4.0 ng/L (Primidone) –  
26.1 µg/L (Caffeine)  
0.5 mg/L (Metformin)

Sat. 15/03/14  
2-h influent wastewater



### I. Target Screening



## II. Suspect Screening

### 1. in-house database

- more than 10000 EPs and TPs
  - from *prediction models* (UM-PPS, Metabolite Predict)
  - ← from *literature*
  - ← from *regulation bodies* (REACH)

...including information over:

1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30
rt	rt	POS	chem formula	name	CAS	coelement	coelement	relative	minimum	hydrogen	hydrogen	Q1	Q2	Q3	Q1 min	Q1 max	Q2 min	Q2 max	Q3 min	Q3 max	Q4 min	Q4 max	Q5 min	Q5 max	Q6 min	Q6 max	Q7 min	Q7 max	
3			C21H30O2	11a-Hydroxiprogesterone																									
3			C20H30O2	11-Hydroxypregnenolone																									
4			C21H30O2	11-Hydroxypregnenolone																									

### 2. Retention time prediction tool KNN-GA-SVM

### 3. High Resolution Mass Spectral Libraries

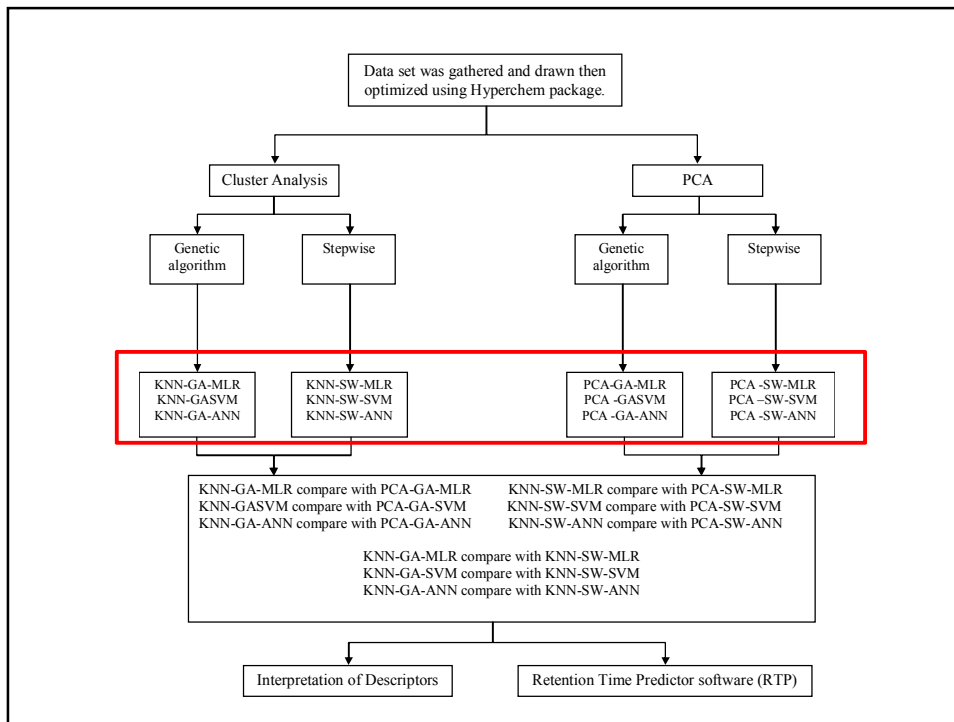
for MS/MS data (MassBank, MetFrag)



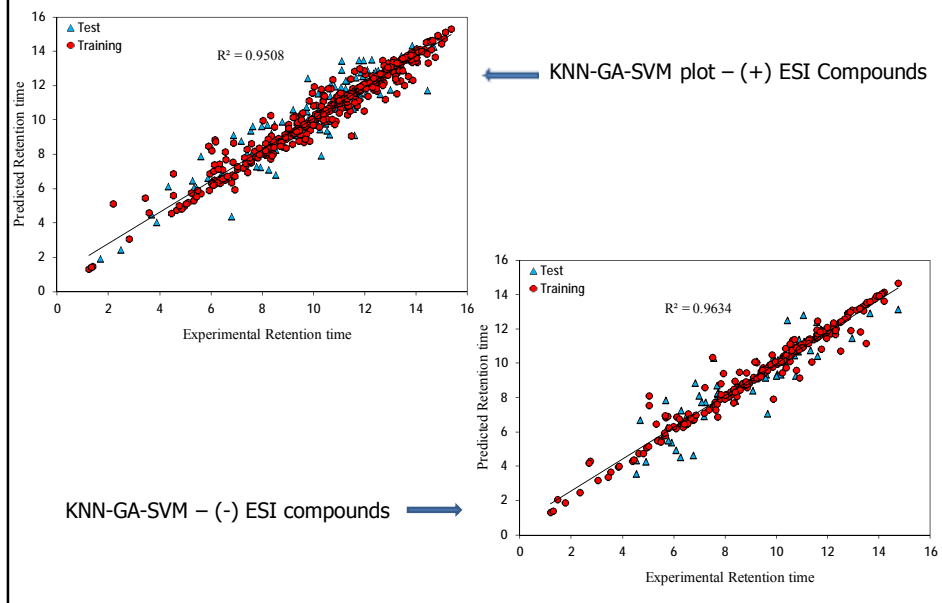
## Retention Time Prediction Models

### QSAR/QSPR procedure:

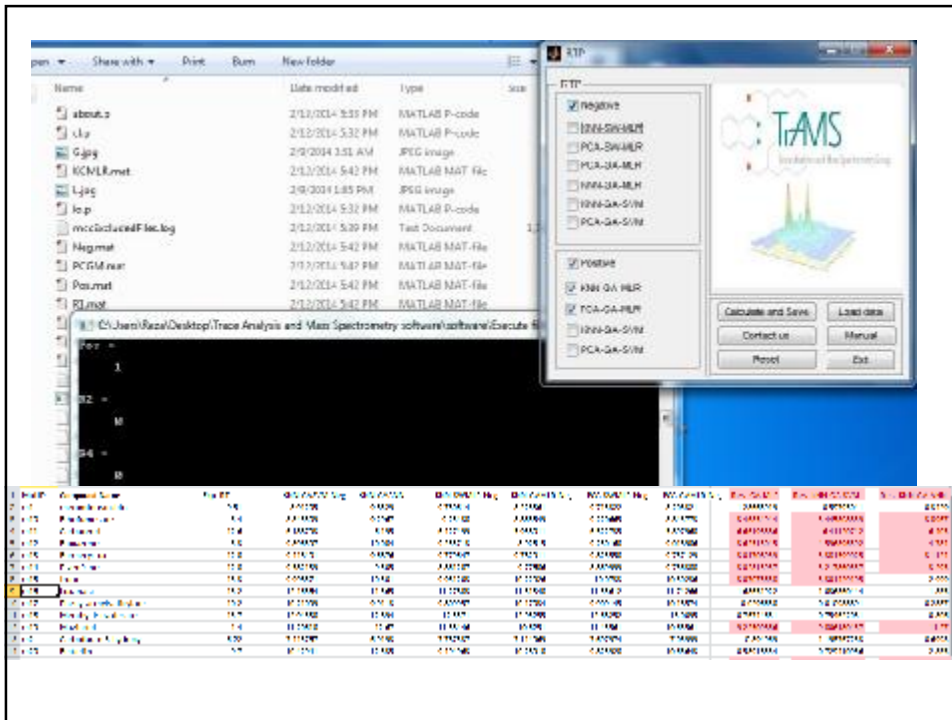
1. Optimization by HyperChem / MOPAC
2. Molecular descriptors by Dragon (zero, constant and near-constant, and collinear descriptors were removed)
3. Division of dataset to training and test datasets by clustering (KNN) or PCA
4. Selection of the relevant descriptors by Stepwise or Genetic algorithm
5. Build of models by MLR, ANNs, and SVM and their comparison



The best prediction accuracy was achieved by **KNN-GA-SVM model** for both positive and negative ESI compounds.

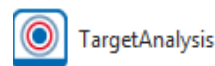






## Optimization & Validation

## II. Suspect Screening



### Criteria

- ✓ Peak Area/Intensity Ratio > 4
- ✓ False Negative Results < 10%

...in order exclude too many irrelevant peaks !

Application to "artificial" suspect

at 5 concentration levels (1 – 0.025 µg/L)

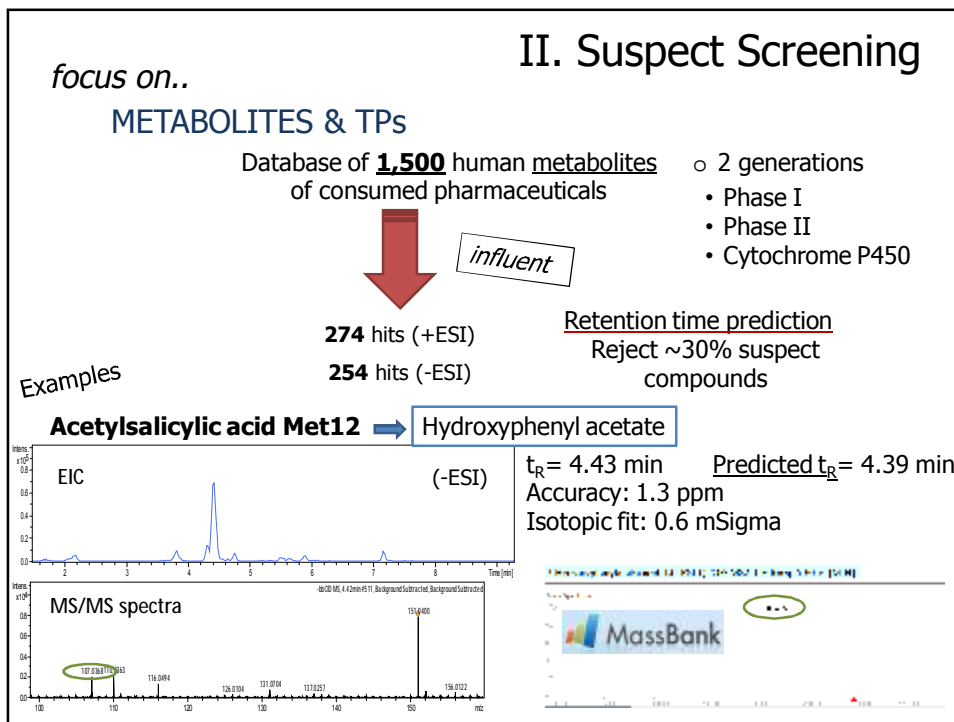
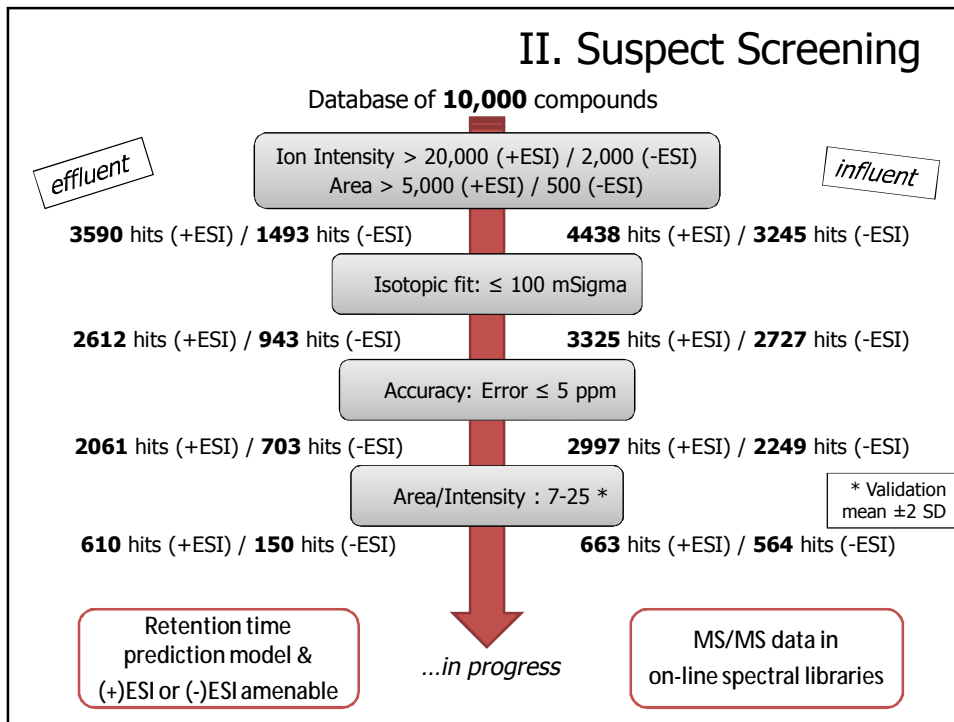
### % False Negative

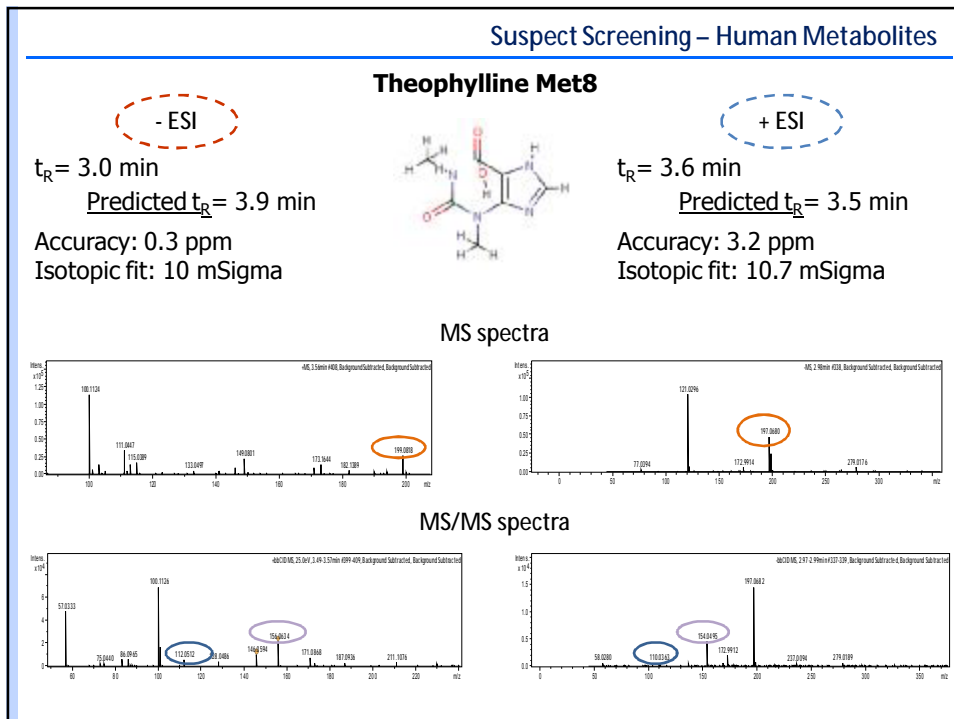
C (µg/L)	+ESI	-ESI
1	9.8	0
0.5	11	6.2
0.25	19	27
0.05	61	40
0.025	88	50

### Thresholds

Peak Area: 20,000 + ESI  
Intensity: 5,000

- ESI  
Peak Area: 2,000  
Intensity: 500





## III. Non-target Screening

### WHY NON-TARGET?

### III. Non-target Screening

<b>TARGET SCREENING</b>	<ul style="list-style-type: none"> <li>✓ Known substance</li> <li>✓ Reference standard available</li> </ul>	<ul style="list-style-type: none"> <li>✓ Unequivocal identification</li> <li>✓ Possible quantification</li> </ul>
<b>SUSPECT SCREENING</b>	<ul style="list-style-type: none"> <li>✓ Suspect substance</li> <li>✓ No reference standard available</li> </ul>	<ul style="list-style-type: none"> <li>✓ Qualitative detection possible</li> </ul>

**What proportion of substances present in the samples are actually detected with target and suspect screening?**

### III. Non-target Screening

- ✓ Usually, many of the most intense peaks do not correspond to substances included in the target and suspect screening lists.
- ✓ These substances are potentially relevant, due to their high concentration.

✓ **Identification of these substances is environmentally relevant**



#### NON-TARGET SCREENING

- ✓ No former information on the analytes
- ✓ Molecular structures can be assigned on the basis of the exact mass, isotopic pattern and fragmentation information

✓ *Nevertheless, full identification of unknown compounds is often difficult & there is no guarantee of a successful outcome*

### III. Non-target Screening

#### STANDARD SCREENING WORKFLOW

Full scan (MS) and Product ion spectra (MS/MS)  
Accurate mass measurements



Automatic peak detection using Algorithms  
(High number of peaks)



Determination of the Elemental compositions of the unknowns



Determination and evaluation of candidates  
(Tentative) Identification of TPs  
• *Interpretation of the fragmentation pathway*  
• *Chromatographic retention time plausibility*



Confirmation: RT and MS/MS of chemical standards, when available

- ✓ Large effort on manual data evaluation
- ✓ Systematic strategies with automated approaches are required to prioritize relevant peaks on which the identification efforts should focus

**PROPOSED APPROACH****III. Non-target Screening**

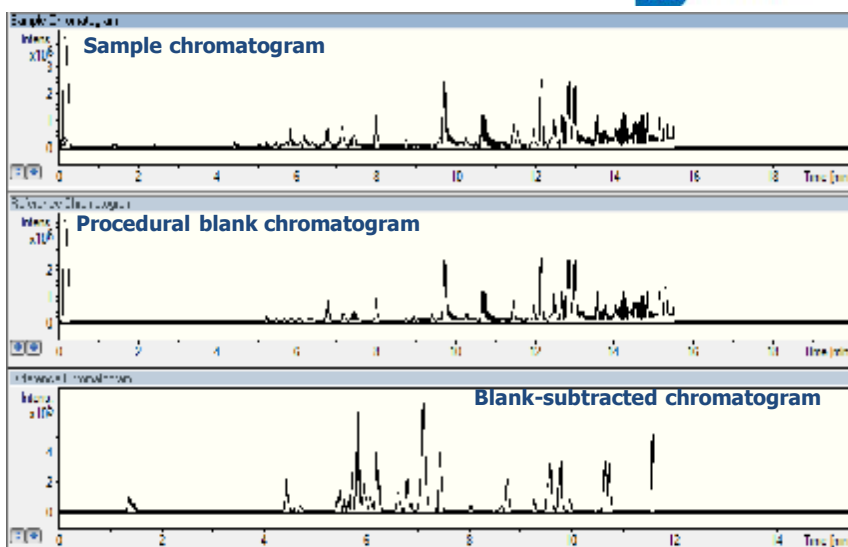
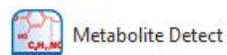
- ✓ Analyses are carried out in the same way previously described for target and suspect screening, except that AutoMSMS is performed (MS/MS data of the 5 most intense peaks per scan event).

**Non-target steps:**

- ✓ Blank subtraction
- ✓ Peak peaking procedure
- ✓ Prioritization of peaks for further evaluation
- ✓ Determination of elemental composition
- ✓ Evaluation of possible candidates → Tentative identification

**BLANK SUBTRACTION****III. Non-target Screening**

- ✓ Use of metabolomics tools



### III. Non-target Screening

#### PEAK PEAKING PROCEDURE

✓ Peak peaking: **Molecular features Algorithm**

- Using *Data analysis* and *Target analysis (Bruker)*
- Threshold: Signal/Noise > 10

➔ **A high number of peaks (> 3500) was obtained**

#	RT [min]	Area	Int. type	S	S/N	Mass. m/z
1	1.1	22025.0	MolFeature	1108	12.1	151.0084
2	1.1	455.2	MolFeature	555	15.5	443.3103
3	1.1	30852.8	MolFeature	2927	11.1	181.038
4	1.1	180714.3	MolFeature	14088	26.1	282.0988
5	1.1	74931.0	MolFeature	6443	28.0	272.4715
6	1.1	74252.5	MolFeature	7411	44.9	105.8858
7	1.1	18137.0	MolFeature	1588	17	251.0721
8	1.1	14773.7	MolFeature	1704	24.0	481.4444
9	1.1	6754.3	MolFeature	472	10.5	834.8444
10	1.1	110345.7	MolFeature	14793	18.5	478.488
11	1.1	8017.2	MolFeature	927	10.0	400.9612
12	1.1	8890.5	MolFeature	804	17.9	488.9128
13	1.1	88819.9	MolFeature	8436	25.4	261.8884
14	1.1	73703.8	MolFeature	5180	27.6	378.9341
15	1.1	5840.0	MolFeature	528	14	534.9594
16	1.1	14147.8	MolFeature	1404	11.8	242.4417
17	1.1	81824.7	MolFeature	4804	22.5	181.0011
18	1.1	701541.0	MolFeature	54347	17.1	284.3183
19	1.1	8400.8	MolFeature	1010	11.0	378.8721
20	1.1	140317.0	MolFeature	10180	62.1	183.034
21	1.1	10108	MolFeature	7108	14.5	343.4117
22	1.1	108310.8	MolFeature	10282	26.8	215.8489
23	1.1	17145.8	MolFeature	1182	18.0	412.3716
24	1.1	12114	MolFeature	2640	15.5	222.0387

### III. Non-target Screening

#### PRIORITIZATION OF PEAKS FOR FURTHER EVALUATION

- ✓ Selection of the **most relevant** from the large peak list  
(Not included either in the target or the suspect screening)

##### Criteria:

- Intensity
- Presence of a distinctive isotopic pattern

Non-target identification was performed on selected masses from the top most intense peaks

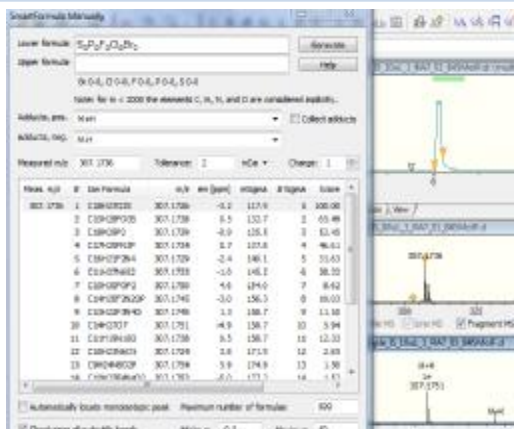
### III. Non-target Screening

#### DETERMINATION OF ELEMENTAL COMPOSITION

1st step: **Generation of possible molecular formula(s)**

##### Criteria:

- Mass accuracy → threshold: 5 ppm
- Agreement of the theoretical and measured isotopic pattern



#### DETERMINATION OF ELEMENTAL COMPOSITION: SEVEN GOLDEN RULES (SGR)

✓ **Plausibility of the generated molecules** → Use of the **Seven Golden Rules** software

*"Seven golden rules for heuristic filtering of molecular formulas obtained by accurate mass spectrometry"*

- Element number restrictions
- Lewis and Senior chemical rules check
- Isotopic pattern filter
- Hydrogen/carbon ratio check
- Element ratio of nitrogen, oxygen, phosphorus and sulphur vs carbon check
- Element ratio probability check
- Check of the presence of trimethylsilylated compounds

**30 million compounds database** → **Great reduction of the possibilities**

✓ The correct molecular formula is assigned with a probability of 98%, if the formula exists in a compound database

*Kind and Fiehn. BMC Bioinformatics 8:105 (2007)*

### EVALUATION OF POSSIBLE CANDIDATES

- ✓ Number of candidates to one molecular formula: **1 - >2000**  
(Chemspider, Pubmed databases)

#### Approaches for tentative identification:

- ✓ **Databases** (e.g. MassBank) → Still very limited number of compounds  
(not very useful for non-target screening)
  - ✓ Deep **study** of the **MS/MS spectra (AutoMSMS analysis)**
  - ✓ **In-silico fragmentation software**
    - Smart formula 3D (Bruker)
    - Metfrag
  - ✓ **Chromatographic retention time** plausibility → Application of models
  - ✓ **Number of data sources and references** in different data bases  
(e.g. Chemspider)
- ✓ To confirm the identity of a substance,  
purchase of reference standard is required (if available)

### EXAMPLE 1: TREATING METFORMIN AS UNKNOWN

#### PEAK PEAKING PRIORIZATION

- ✓ Peak peaking: **Molecular features Algorithm**
  - Threshold: Signal/Noise > 10

➔ **A large amount of peaks (> 3500) obtained**

#	RT [min]	Area	I	S/N	Chromatogram	Max. m/z
31	1.38	23464522.0	2383580	26.3	Metformin, 130.1087±0.002, C 4H 11N 5, 1.4min	130.1091
53	1.91	39184028.0	2186079	508.8		145.0977

#### Metformin

#	RT [min]	Area	I	S/N	Chromatogram	Max. m/z
31	1.38	23464522.0	2383580	26.3	Metformin, 130.1087±0.002, C 4H 11N 5, 1.4min	130.1091

#### Compound detected using the TARGET ANALYSIS approach

374	6.44	18125204.0	1262588	379.6		808.3899
522	6.13	17883796.0	1262524	262.7		520.3356

Non-target identification was performed on 16 selected masses from the top most intense peaks

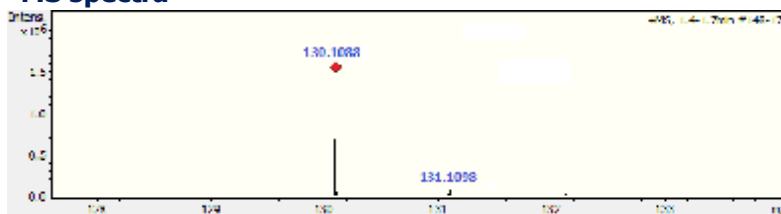


**EXAMPLE 1: TREATING METFORMIN AS UNKNOWN**

- Experimental accurate mass: 130.1088
- Retention time: 1.4 min



**MS spectra**



**EXAMPLE 1: ELEMENTAL COMPOSITION DETERMINATION**



Lower formula:  $S_3P_3F_9Cl_3Et_3$  Generate

Upper formula: Help

Br 0-0, Cl 0-0, F 0-0, P 0-0, S 0-0

Note: for n < 2000 the elements C, H, N, and O are considered implicitly.

Adducts, pos: NH  Collect adducts

Adducts, neg: NH

Measured m/z: 130.1088 Tolerance: 2 info Charge: 1

Mass	m/z	#	Emp Formula	m/z	amt	[ppm]	mSigma	# Sigma	Score	rd	a
130.1088	1	C4H12N5	130.1087	0.6	10.6	1	300.00	1.5			

Number of possible formulas → 1  
(Threshold of 5 ppm and 50 mSigma)

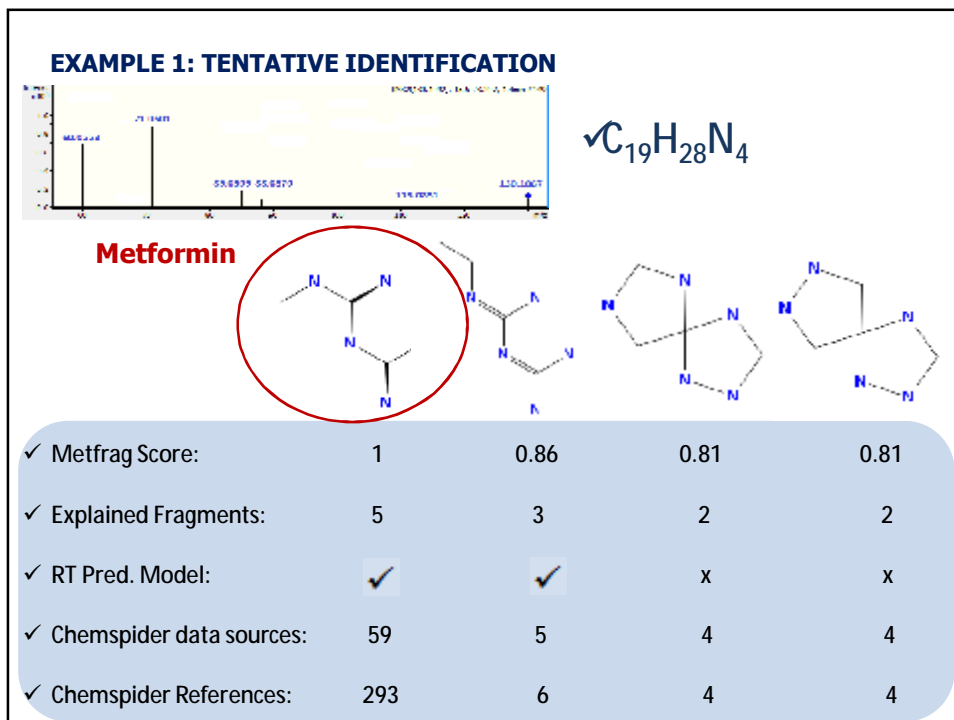
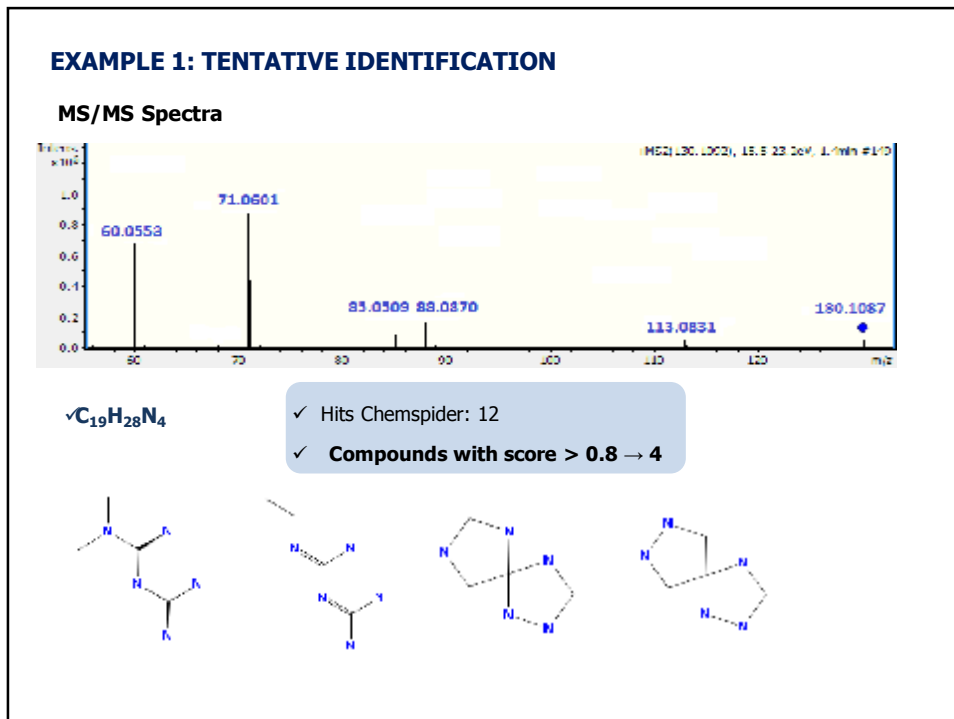
↓

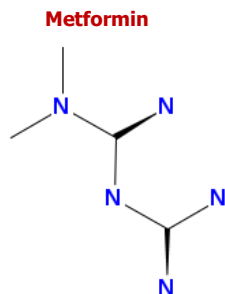
Seven Golden Rules

↓

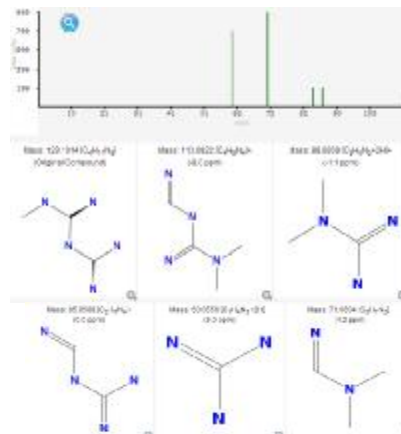
1 Plausible Molecular formula

$C_4H_{12}N_5$



**EXAMPLE 1: TENTATIVE IDENTIFICATION****Metfrag peak explanation**

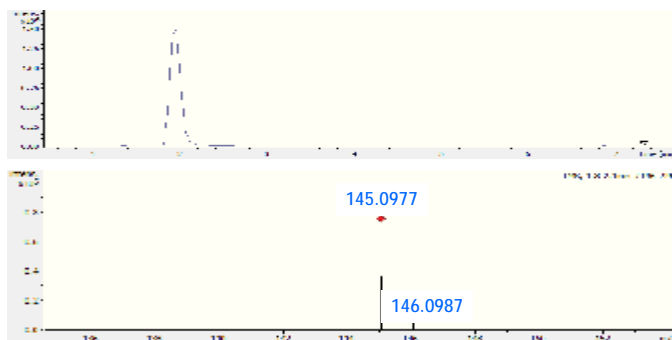
APPLICATION OF RETENTION  
TIME PREDICTION MODEL:  
Experimental RT = 1.38 min  
Predicted RT = 2.5 min



- The developed workflow was applied successfully to identify unambiguously this compound as Metformin

**EXAMPLE 2: APPLICATION OF THE WORKFLOW TO A REAL UNKNOWN**

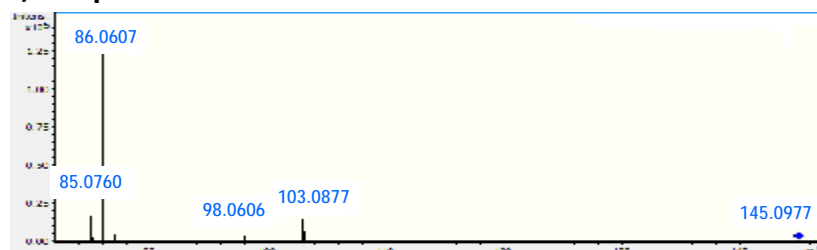
- **Experimental accurate mass: 145.0977**
- **Retention time: 1.9 min**



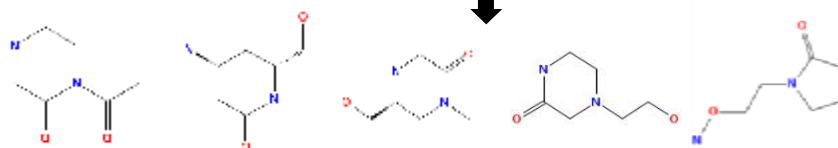
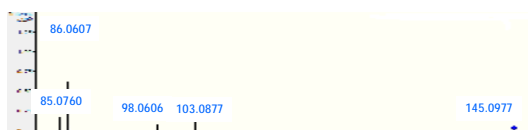
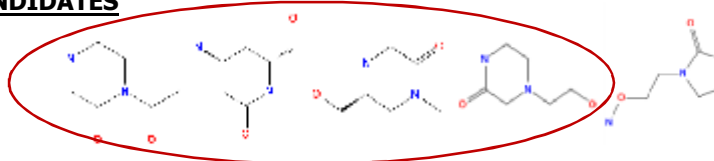
Number of possible formulas  
(Threshold of 5 ppm, 50 mSigma) and  
Seven Golden Rules



1 Plausible Molecular formula  
 $C_6H_{12}N_2O_2$

**EXAMPLE 2: TENTATIVE IDENTIFICATION****MS/MS Spectra**

- ✓ Hits Chempider: 336
- ✓ Compounds with score > 0.9 → 28
- ✓ Only few with more than 3 fragment matches

**EXAMPLE 2: TENTATIVE IDENTIFICATION****TENTATIVE CANDIDATES**

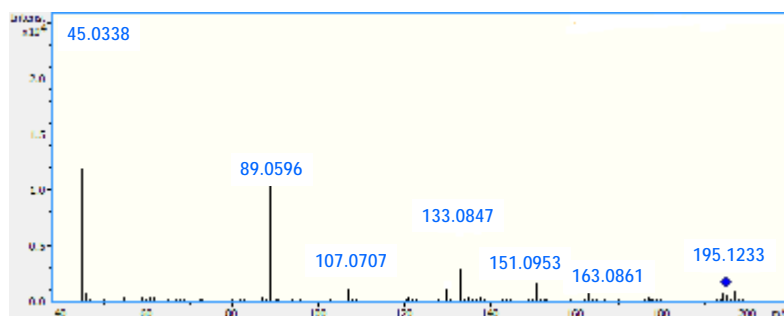
✓ Metfrag Score:	1	0.97	0.95	0.95	0.95
✓ Explained Fragments:	4	4	4	4	3
✓ RT Pred. Model:	✓	✓	✓	✓	x
✓ Chempider data sources:	1	4	5	17	2
✓ Chempider References:	1	4	5	18	2

**EXAMPLE 3: TENTATIVE IDENTIFICATION**

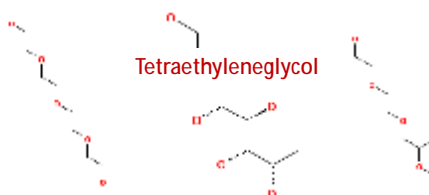
- **Experimental accurate mass: 195.1233**
- **Retention time: 4.2 min**

Number of possible formulas  
(Threshold of 5 ppm, 50 mSigma)  
and Seven Golden Rules

1 Plausible Molecular formula  
 $C_8H_{18}O_5$

**EXAMPLE 3: TENTATIVE IDENTIFICATION**

- ✓ Hits Chemspider: 13 ✓  $C_8H_{18}O_5$
- ✓ 3 compounds with Metfrag score > 0.95 and the others below 0.5



✓ Metfrag Score:	1	1	0.95
✓ Explained Fragments:	5	5	5
✓ RT Pred. Model:	✓	✓	✓
✓ Chemspider data sources:	1	67	2
✓ Chemspider References:	1	379	2

### SUMMARY OF THE LEVELS OF IDENTIFICATION

Retention time (min)	Mass of ion [m/z] (peak of component)	Ion type	Intensity	Molecular formula	Proposed identification name	Level of confirmation of identification
1.28	164.1282	[M+H] <sup>+</sup>	1508655	C7H17NO3		Unequivocal molecular formula
1.91	145.0977	[M+H] <sup>+</sup>	2186079	C6H12N2O2	e.g. 4-(2-Hydroxyethyl)-2-piperazinone	Tentative candidates
2.27	96.0452	[M+H] <sup>+</sup>	1145713	C5H5NO	2-Formyl-1H-pyrrole	Probable structure
4.19						
4.68						formula
4.98						
5.09						formula
5.16						formula
5.2						
5.24						formula
5.73						formula
6.13						
6.44						
9.1	202.1111	[M+H] <sup>+</sup>	1410087	C10H22O3	hydroxyethyl)octanamide	Unequivocal molecular formula
9.4	191.1647	[M+H] <sup>+</sup>	1410087	C10H22O3		Unequivocal molecular formula
12.69	316.1955	[M+H] <sup>+</sup>	1137576	C16H29NO3S	e.g. 1-((2-Methoxyethyl)[(5-methyl-2-thienyl)methyl]amino)-3-[(2-methyl-2-propanyl)oxy]-2-propanol	Tentative candidates

#### ✓ 16 evaluated top intense peaks in +ESI mode

- ✓ 5 Tentatively candidates
- ✓ 7 Unequivocal molecular formula
- ✓ 4 Exact mass of interest

## Conclusions

- Target and suspect HRMS screening workflows were developed and validated
- Target screening can identify app. 10% of the obtained peaks from a LC-QTOFMS analysis
- Suspect screening can explained app. 20% of the obtained peaks
- Non-target workflows are needed for the tentative identification of the highly abundant peaks

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## Thank you for your attention!



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