



FORENSICS @ NIST

#NISTForensics

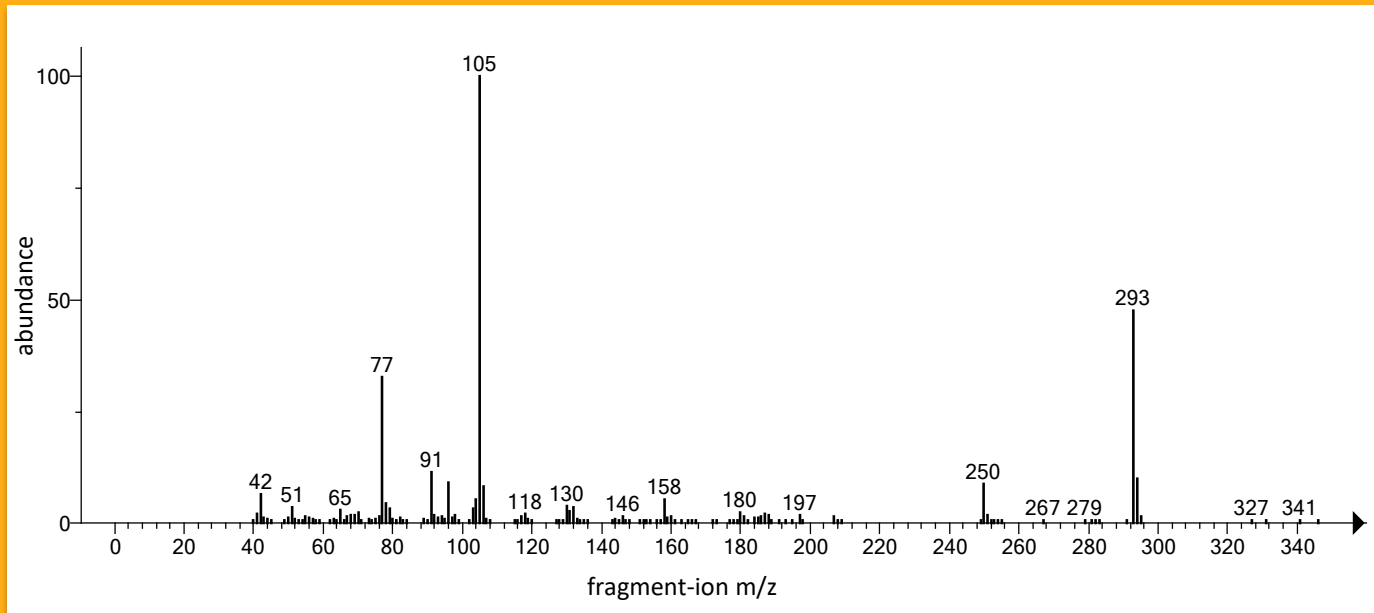
Is it a fentanyl?

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Mass Spectrometry Data Center -- chemdata.nist.gov

Collaborators: WE Wallace, WG Mallard, SE Stein –Mass Spec Data Center, BMD, MML

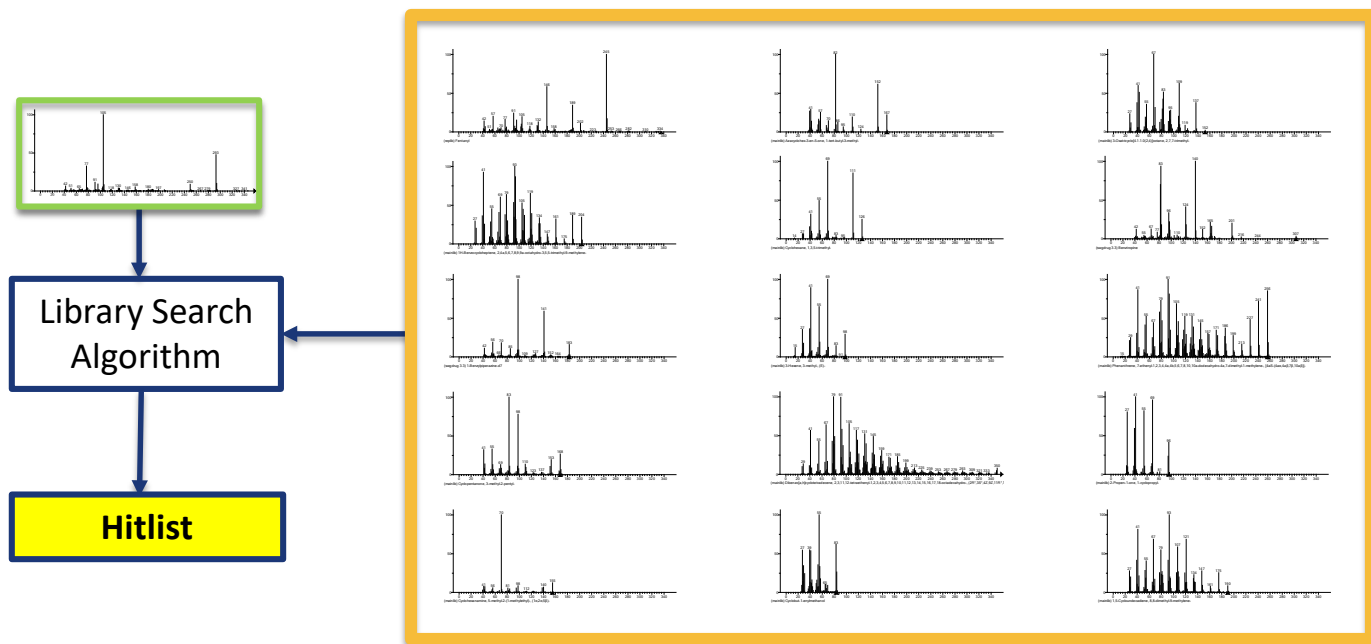
AJ Kearsley – Applied and Computational Math Division, ITL



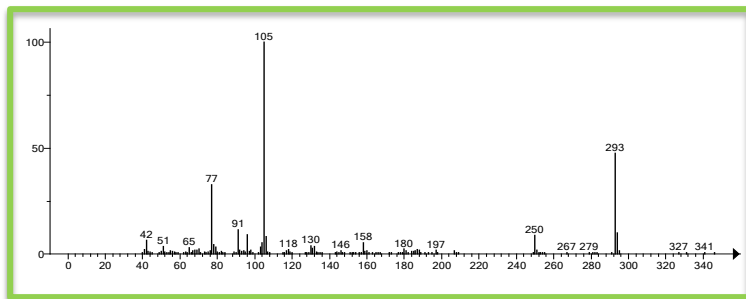
A *mass spectrum* is a histogram detailing the distribution of ***fragment ions*** organized by *mass-to-charge* ratio for a given compound.

Mass Spectral Library Searching

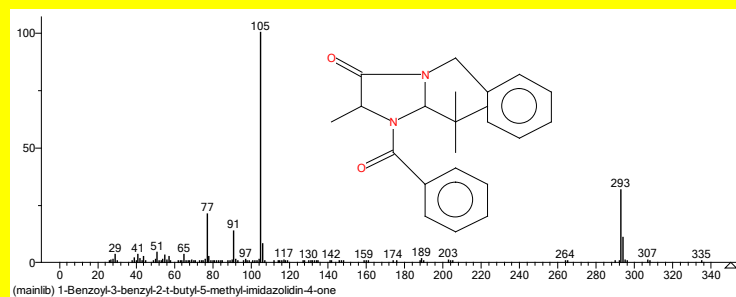
Principle: Given a set (library) of **mass spectra for known** chemical compounds, the identity of an **unknown** chemical compound can be *proposed* by comparing the similarity of the spectrum of the unknown with the spectra contained in the library.



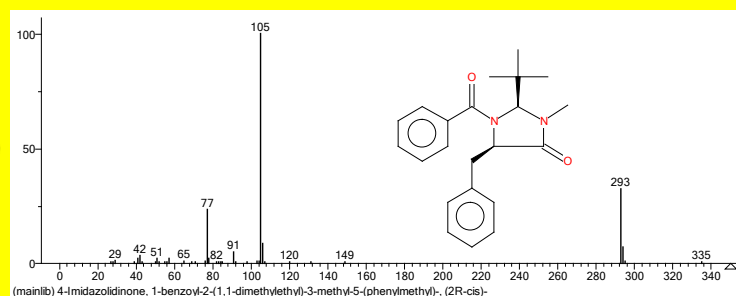
Simple Similarity Search of query against NIST17



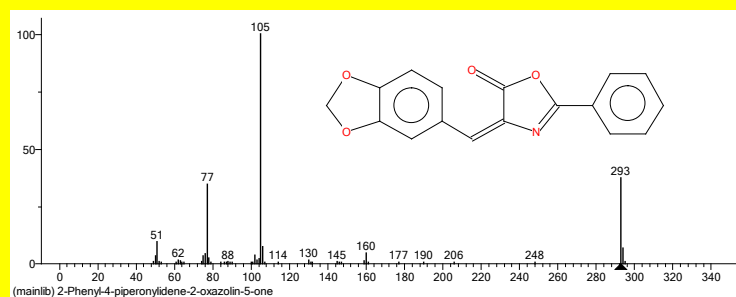
1. (795)



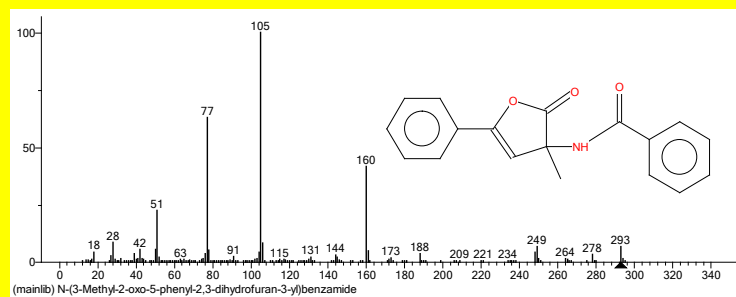
2. (726)



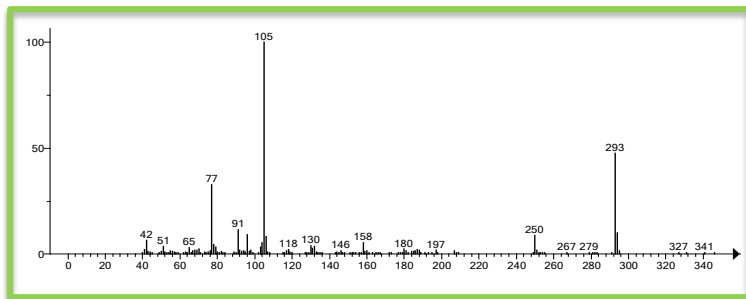
3. (685)



4. (625)

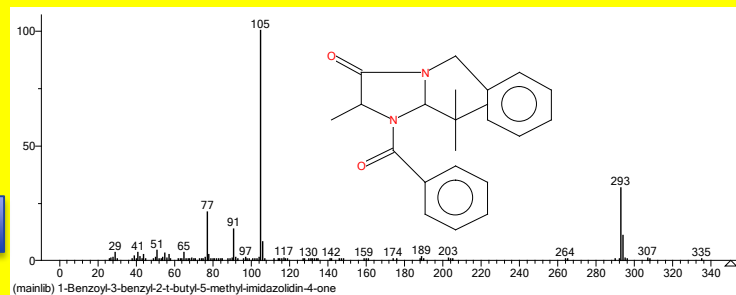


Simple Similarity Search of query against NIST17

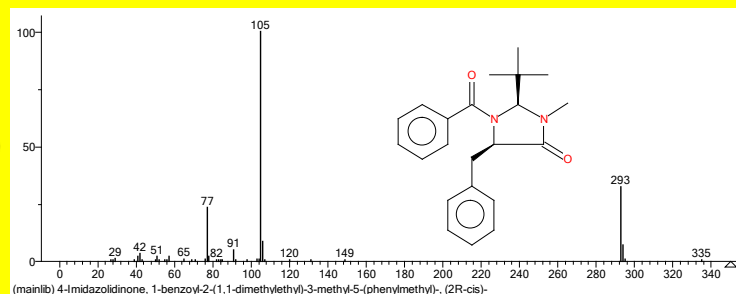


1. (795)

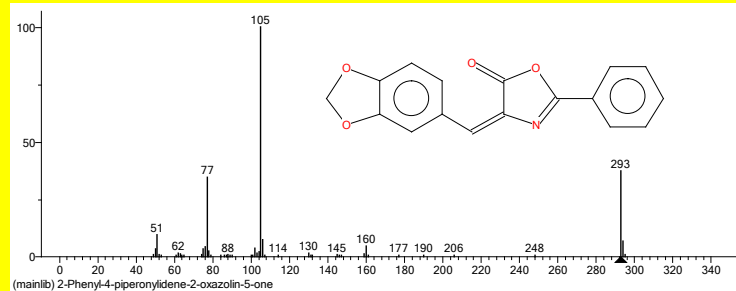
Match Factor



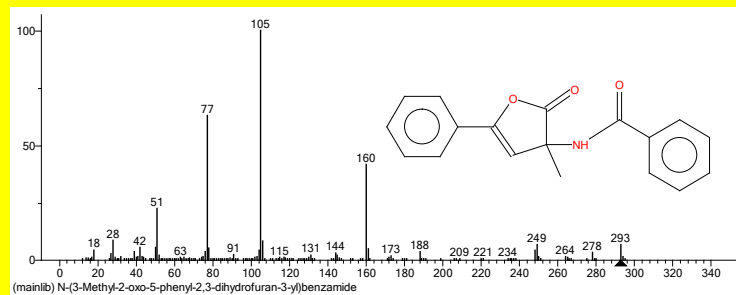
2. (726)



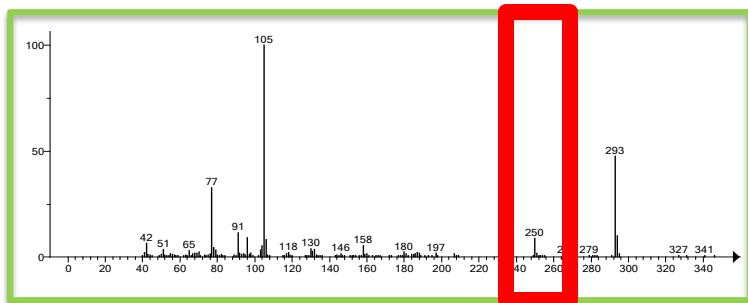
3. (685)



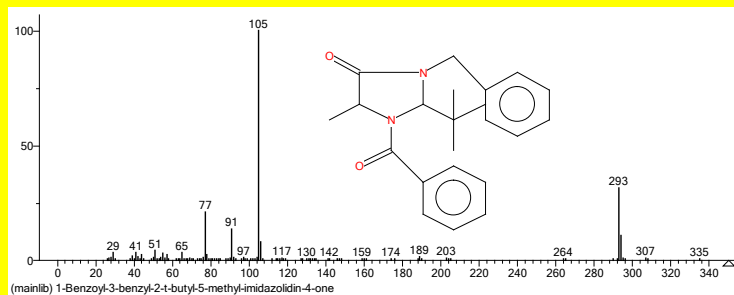
4. (625)



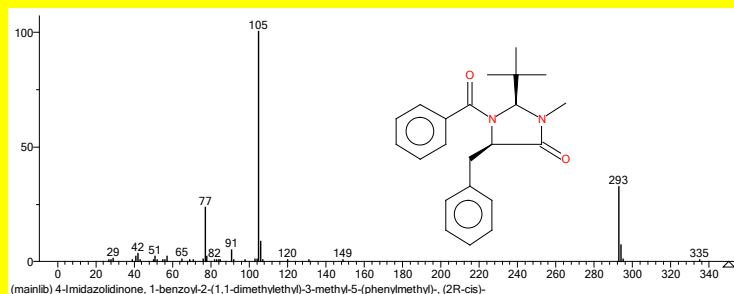
Simple Similarity Search of query against NIST17



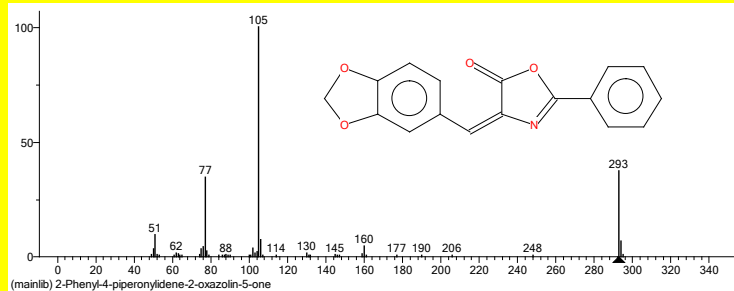
1. (795)



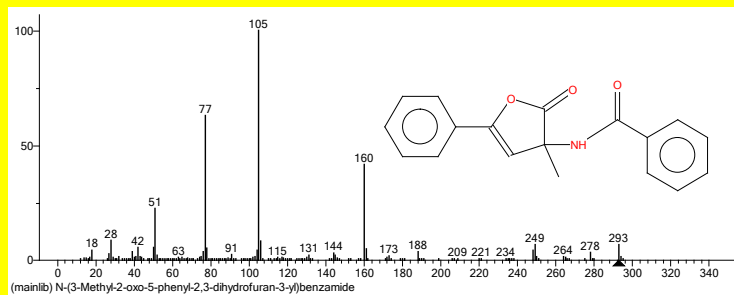
2. (726)



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4. (625)

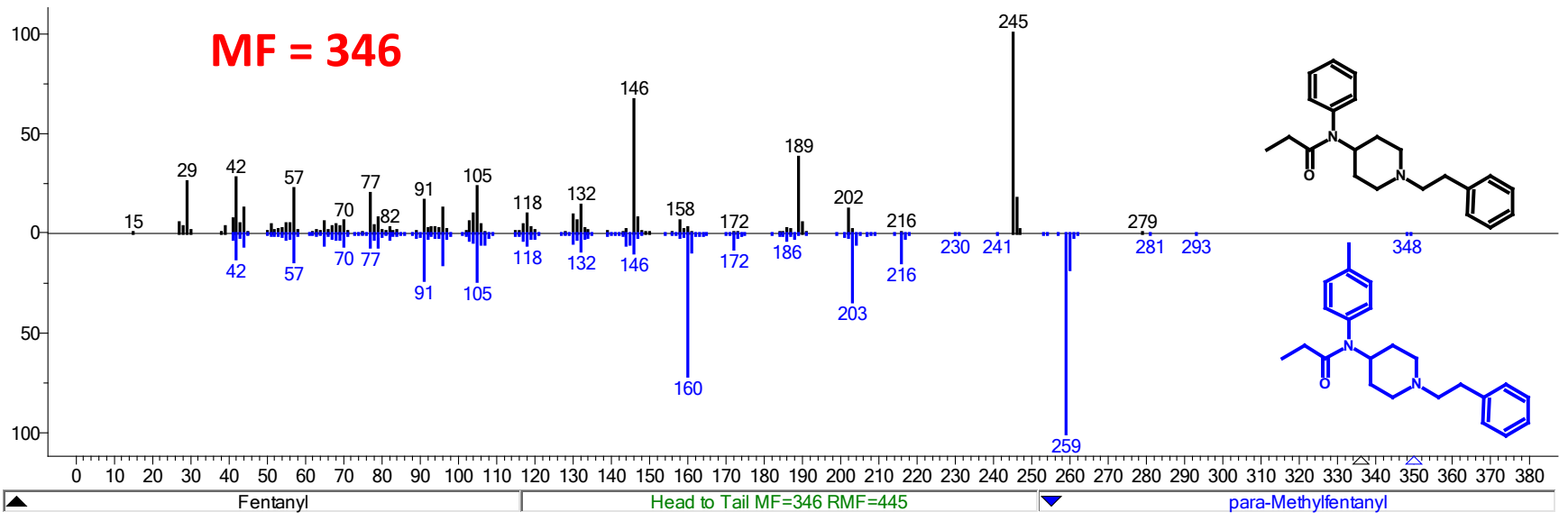


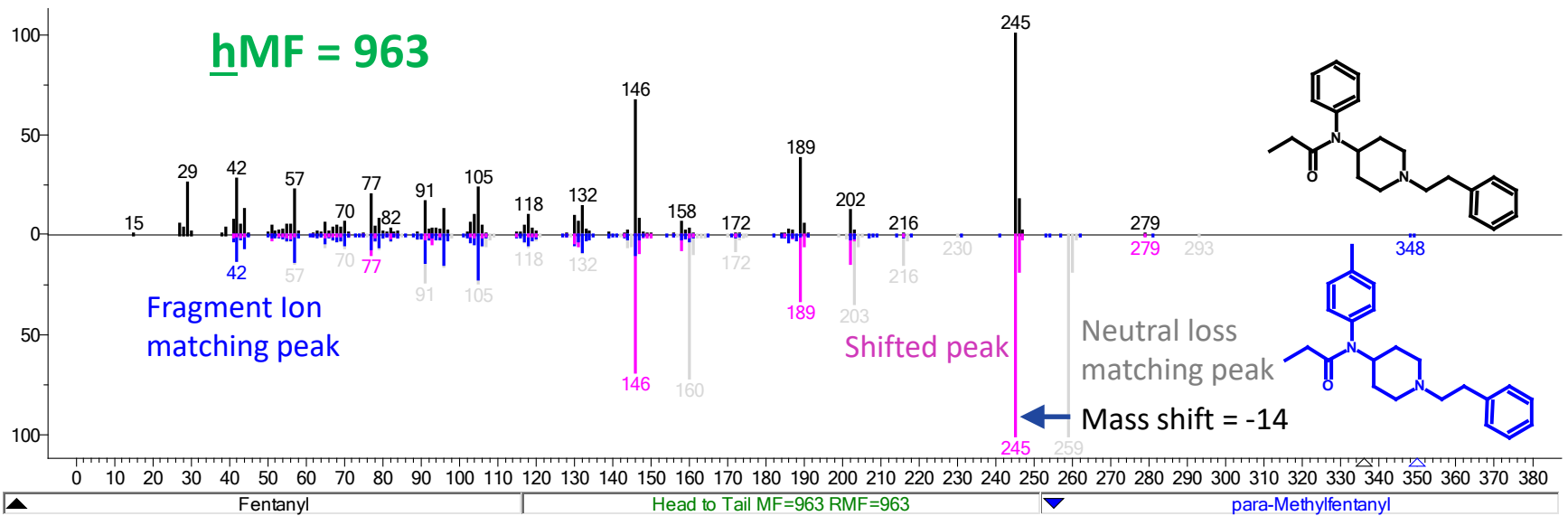
What if a spectrum of the unknown was not contained in the library?

Hybrid Similarity

Hybrid Similarity

- Combines **fragment ion** AND **neutral loss** matching when computing spectral similarity
 - $\text{DeltaMass} = \Delta_m = \text{MW}(\text{Query Compound}) - \text{MW}(\text{Library Compound})$
 - Compare each query peak to two peaks in the library spectrum at corresponding:
 - (1) m/z [match suggests compounds form same fragment ion]
 - (2) $m/z + \text{DeltaMass}$ [match suggests compounds form same neutral loss]

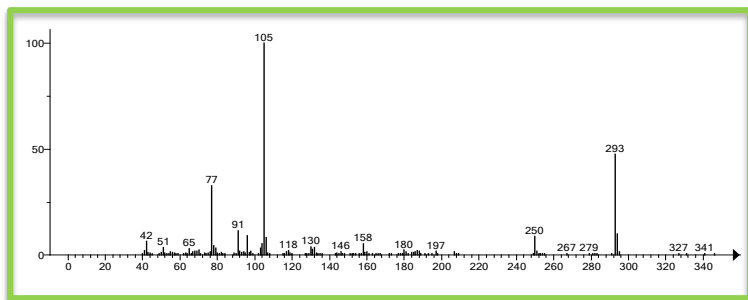




Hybrid Similarity

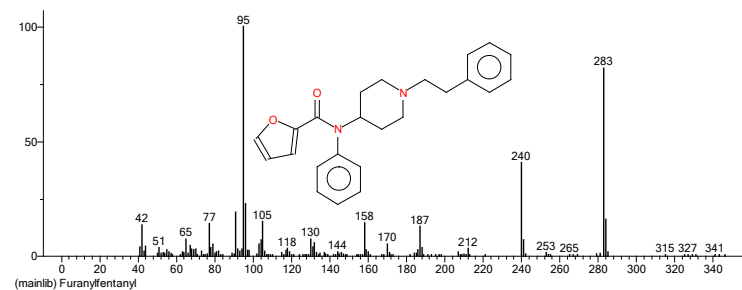
- Combines **fragment ion** AND **neutral loss** matching when computing spectral similarity
 - $\text{DeltaMass} = \Delta_m = \text{MW}(\text{Query Compound}) - \text{MW}(\text{Library Compound})$
 - Compare each query peak to two peaks in the library spectrum at corresponding:
 - (1) m/z [match suggests compounds form same fragment ion]
 - (2) $m/z + \text{DeltaMass}$ [match suggests compounds form same neutral loss]
- Generates high spectral similarity scores between compounds that differ by the insertion/deletion or replacement of a **single** chemical moiety that does not greatly affect fragmentation mechanism

Hybrid Similarity Search of query against NIST17



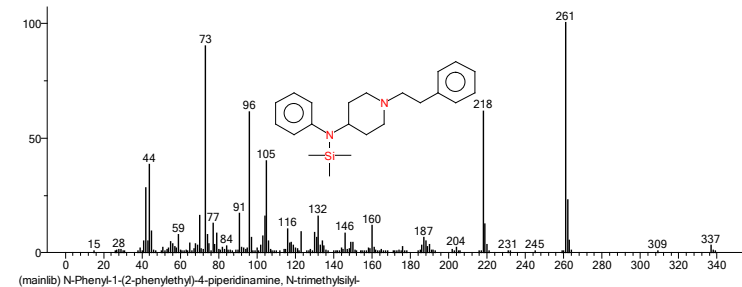
1. (934)

$$\Delta_m = 10$$



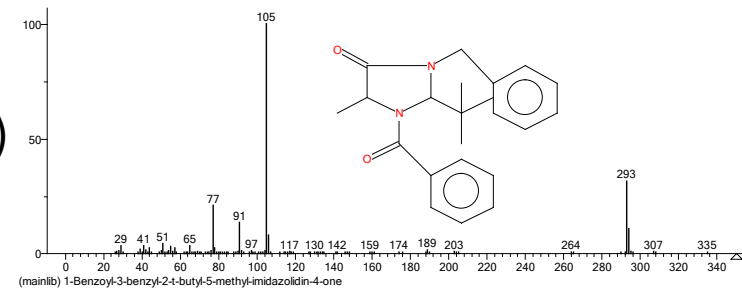
2. (822)

$$\Delta_m = 32$$



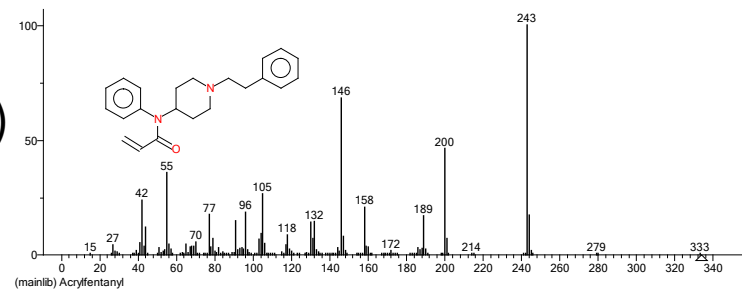
3. (820)

$$\Delta_m = 34$$



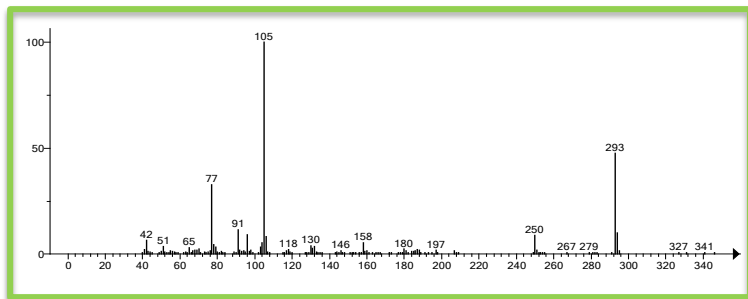
6. (787)

$$\Delta_m = 50$$



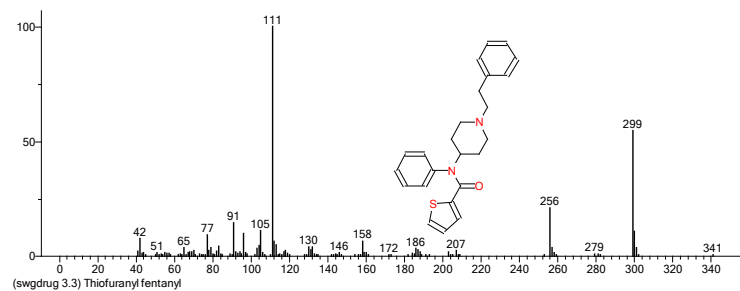
Libraries matter!

Hybrid Similarity Search of query against **SWGDRUG 3.3**



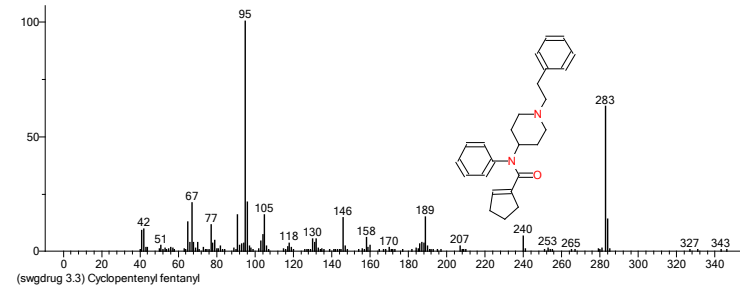
1. (962)

$$\Delta_m = -6$$



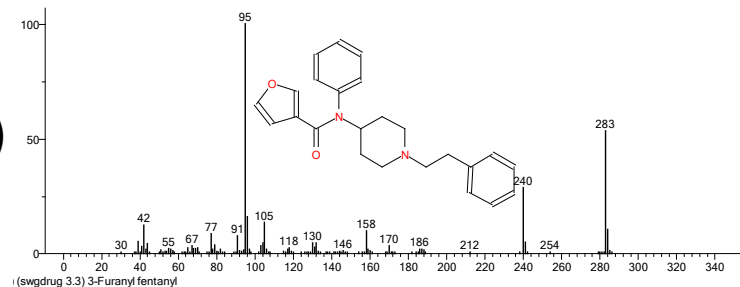
2. (938)

$$\Delta_m = 10$$



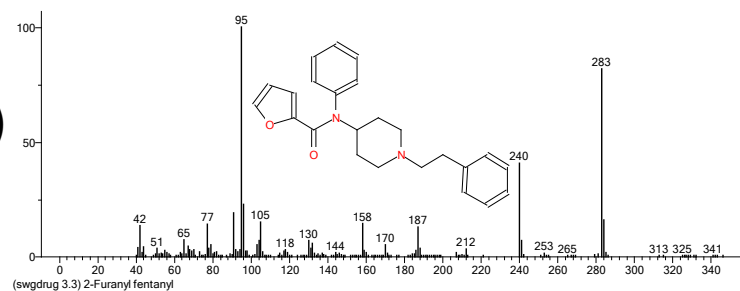
3. (937)

$$\Delta_m = 10$$



4. (936)

$$\Delta_m = 10$$



Can we do more?

Fentanyl ClassifieR

Fentanyl ClassifieR (prototype)

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Objective: Make mass spectral library searching “easier” by re-casting our search question.

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Objective: Make mass spectral library searching “easier” by re-casting our search question.

Trivial example:

Here is an exotic fruit, what is it?

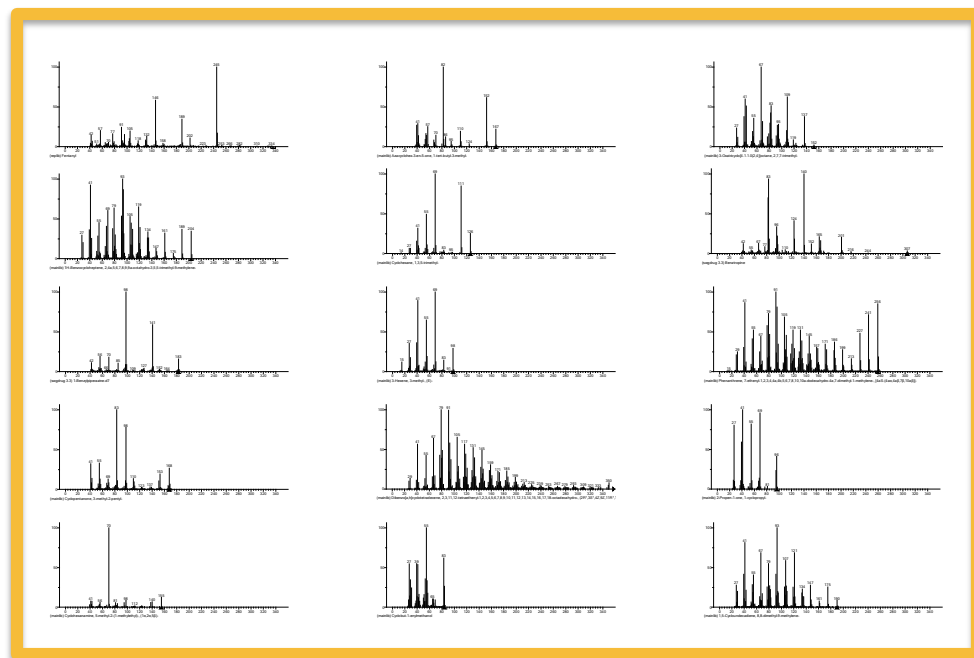
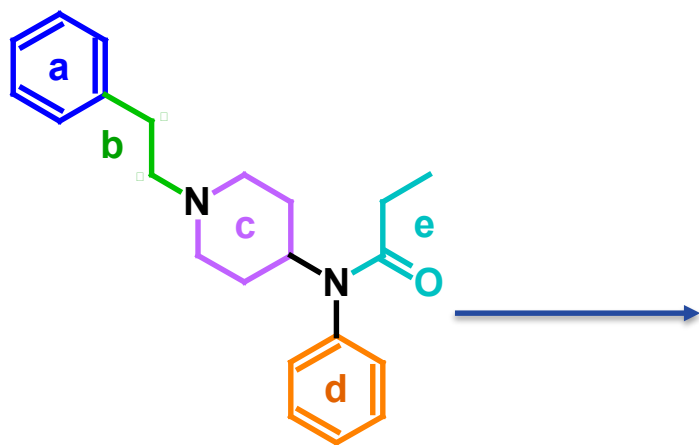
Hard question – requires knowledge of *all* fruit

Here is an exotic fruit, is it an apple?

Easier question – requires knowledge of *all* apples

Fentanyl ClassifieR (prototype)

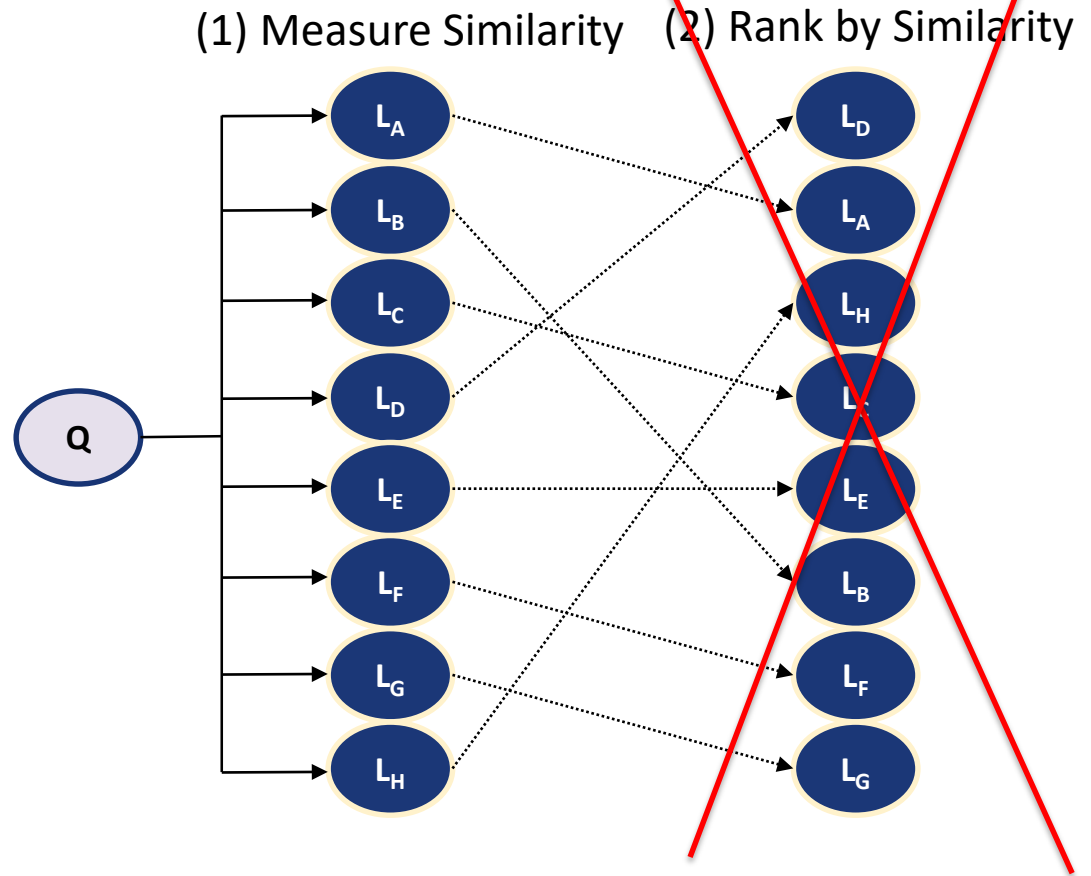
- 1) Build a highly curated library of JUST fentanyl analogs



Fentanyl ClassifieR (prototype)

- 1) Build a highly curated library of JUST fentanyl analogs
- 2) Measure similarity between the query spectrum and the library spectra

Traditional Library Searching



Fentanyl ClassifieR (prototype)

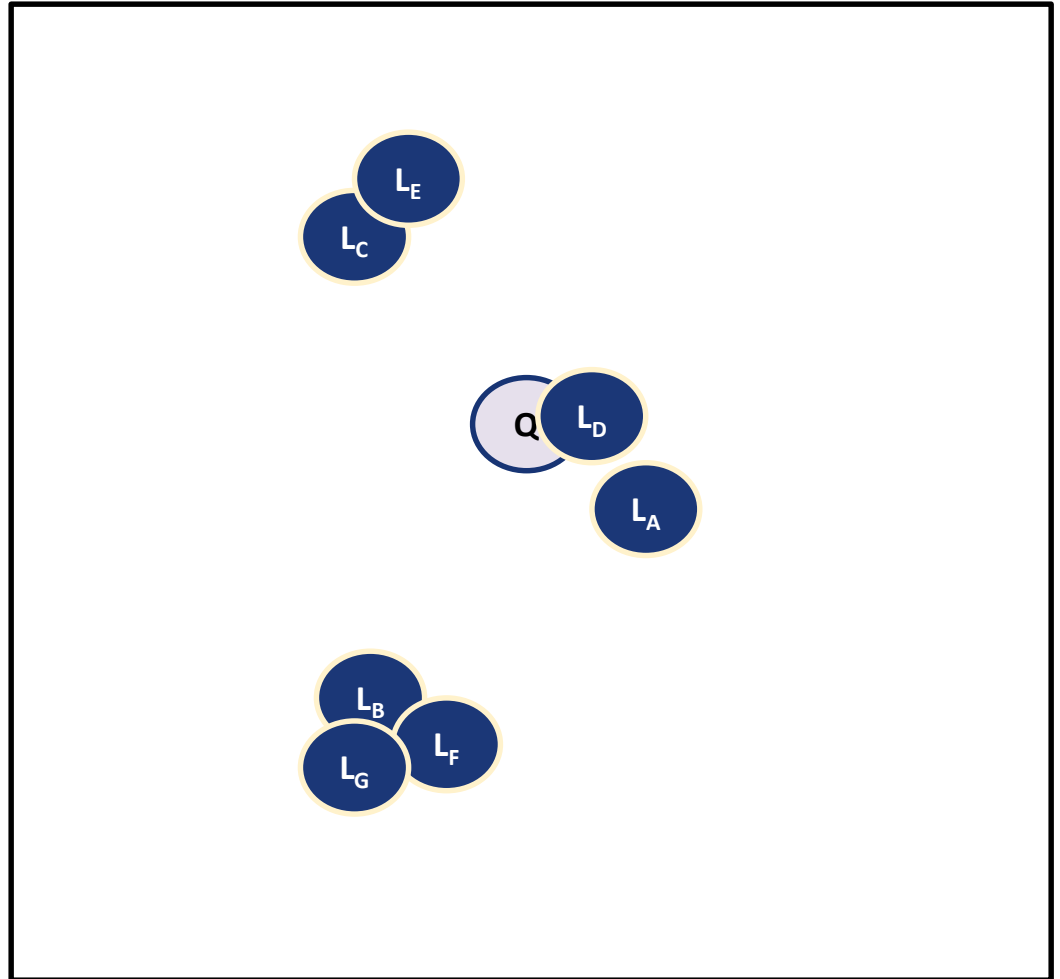
- 1) Build a highly curated library of JUST fentanyl analogs
- 2) Measure similarity between the query spectrum and the library spectra
- 3) Measure similarity between ALL of the fentanyl analog spectra in the library

	Q	L_A	L_B	L_C	L_D	L_E	L_F	L_G
Q	1	s_{aq}	s_{bq}	s_{cq}	s_{dq}	s_{eq}	s_{fq}	s_{gq}
L_A	s_{qa}	1	s_{ba}	s_{ca}	s_{da}	s_{ea}	s_{fa}	s_{ga}
L_B	s_{qb}	s_{ab}	1	s_{cb}	s_{db}	s_{eb}	s_{fb}	s_{gb}
L_C	s_{qc}	s_{ac}	s_{bc}	1	s_{dc}	s_{ec}	s_{fc}	s_{gc}
L_D	s_{qd}	s_{ad}	s_{bd}	s_{cd}	1	s_{ed}	s_{fd}	s_{gd}
L_E	s_{qe}	s_{ae}	s_{be}	s_{ce}	s_{de}	1	s_{fe}	s_{ge}
L_F	s_{qf}	s_{af}	s_{bf}	s_{cf}	s_{df}	s_{ef}	1	s_{gf}
L_G	s_{qg}	s_{ag}	s_{bg}	s_{cg}	s_{dg}	s_{eg}	s_{fg}	1

Pre-computed

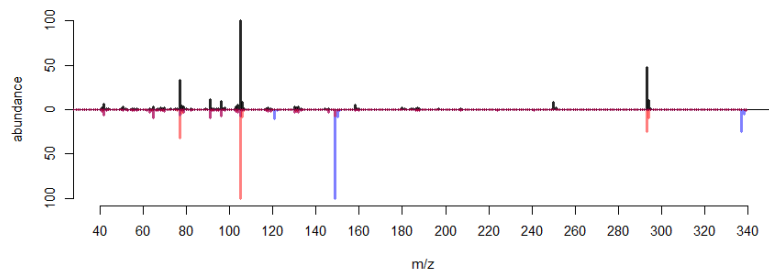
Fentanyl ClassifieR (prototype)

- 1) Build a highly curated library of JUST fentanyl analogs
- 2) Measure similarity between the query spectrum and the library spectra
- 3) Measure similarity between ALL of the fentanyl analog spectra in the library
- 4) Learn (*e.g. cluster*)



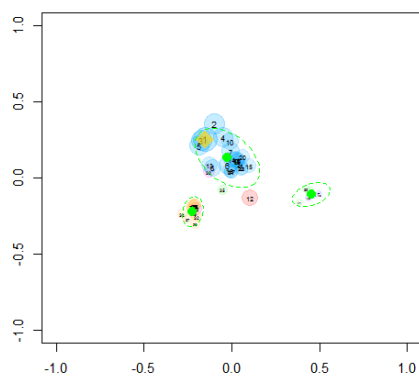
Fentanyl Classifier (MS Search Details)

Molecular weight information was contained in the Query MSP. The nominal MW of 384 Da was employed in the Hybrid Search.



Hit List

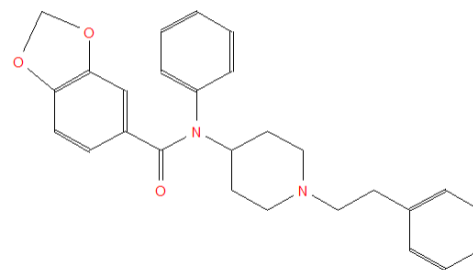
Hit Map



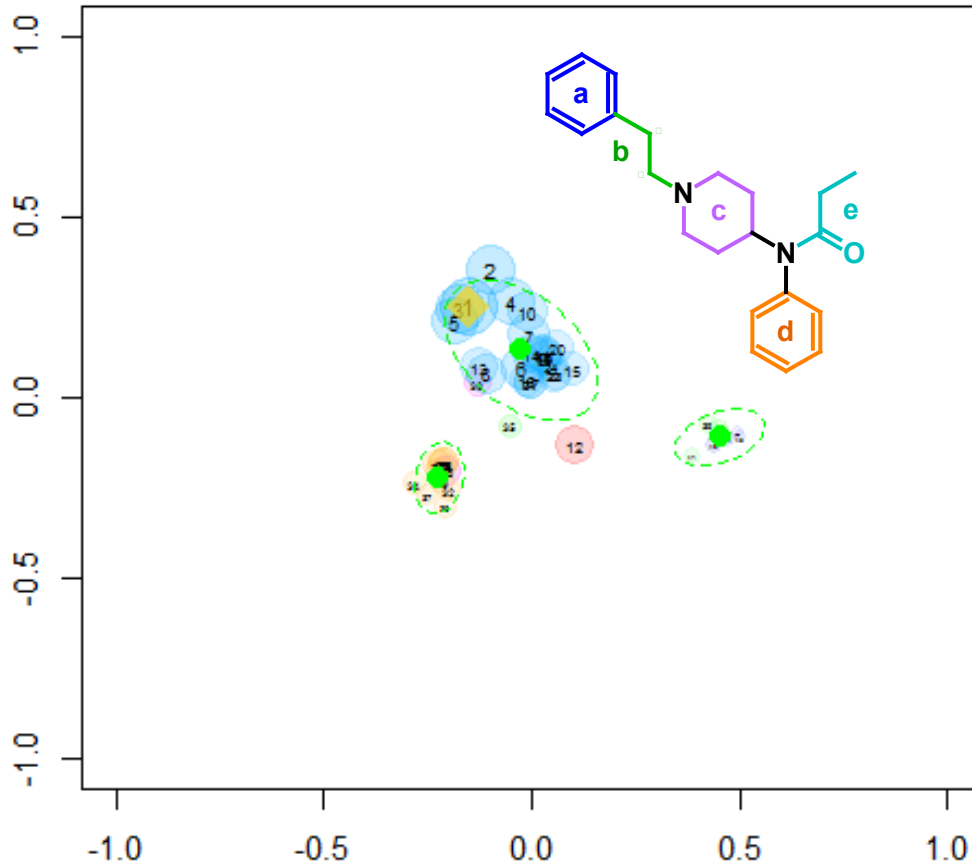
■ Fentanyl ■ Mod Type A ■ Mod Type B ■ Mod Type C ■ Mod Type D ■ Mod Type E

Proposed Hit Details

Name: Benzodioxole fentanyl
Formula: C₂₇H₂₈N₂O₃
Exact Mass: 428.21
MW: 428
InChIKey: [ZFAAZMIOHJNKGDUHFFFAOYSA-N](#)
Confidence: 0.42



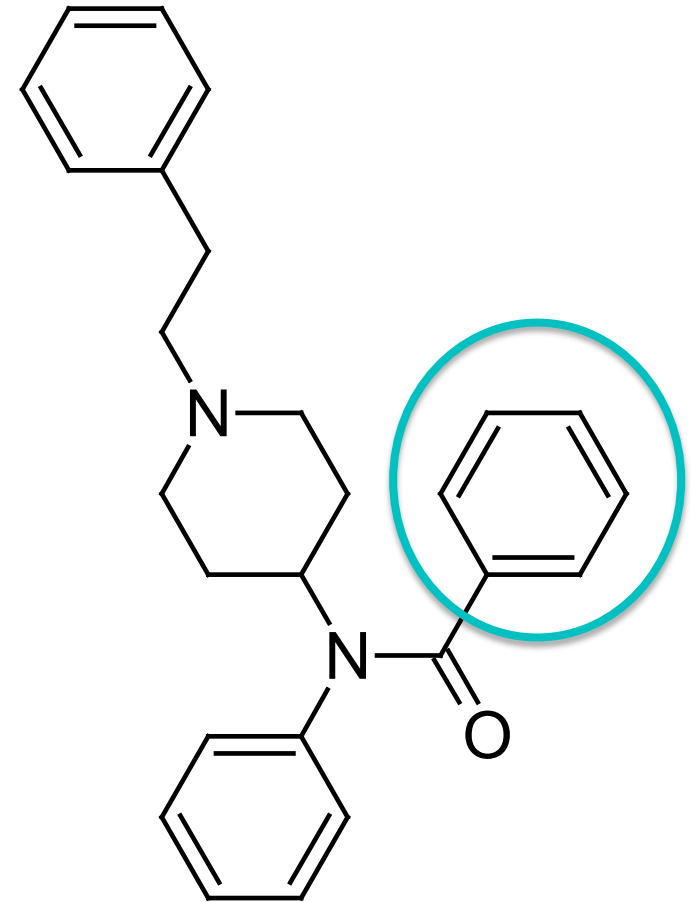
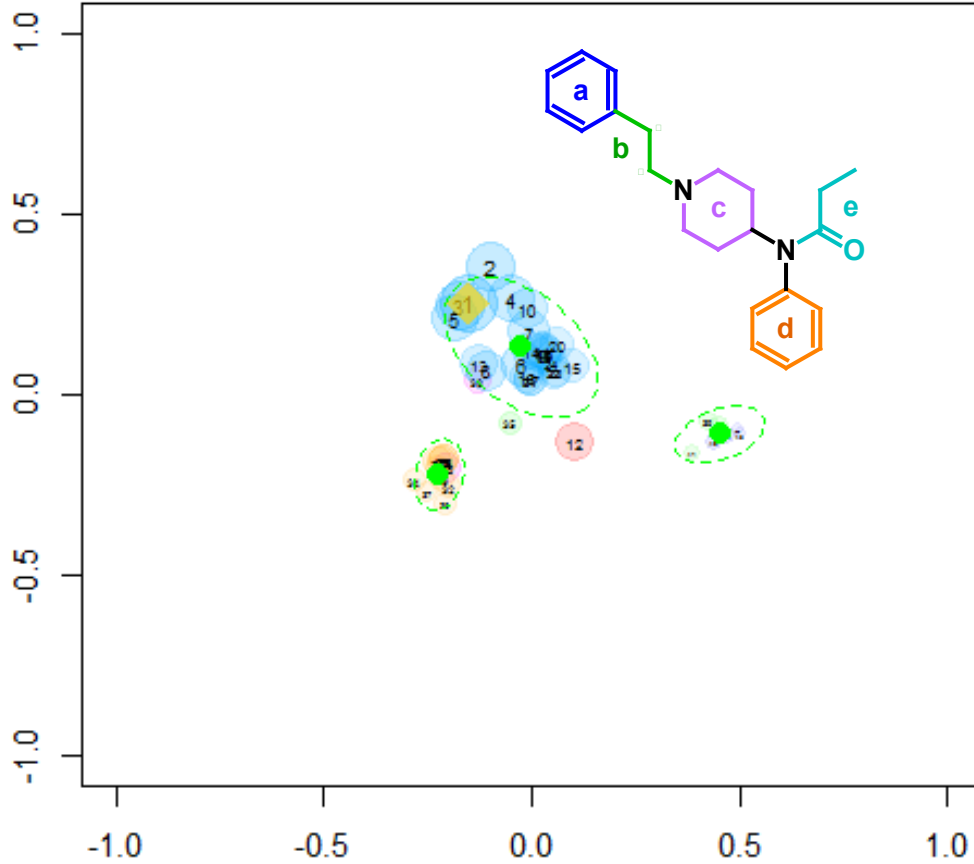
Fentanyl ClassifieR (prototype)



Compound	hMF	Δ_m	Relatedness Index
Benzodioxole fentanyl – E	861	-44	0.42
3-Furanyl fentanyl – E	839	10	0.57
Cyclopentyl fentanyl – E	819	10	0.48
2-Furanyl fentanyl – E	816	10	0.51
Acryl fentanyl – E	775	50	0.25

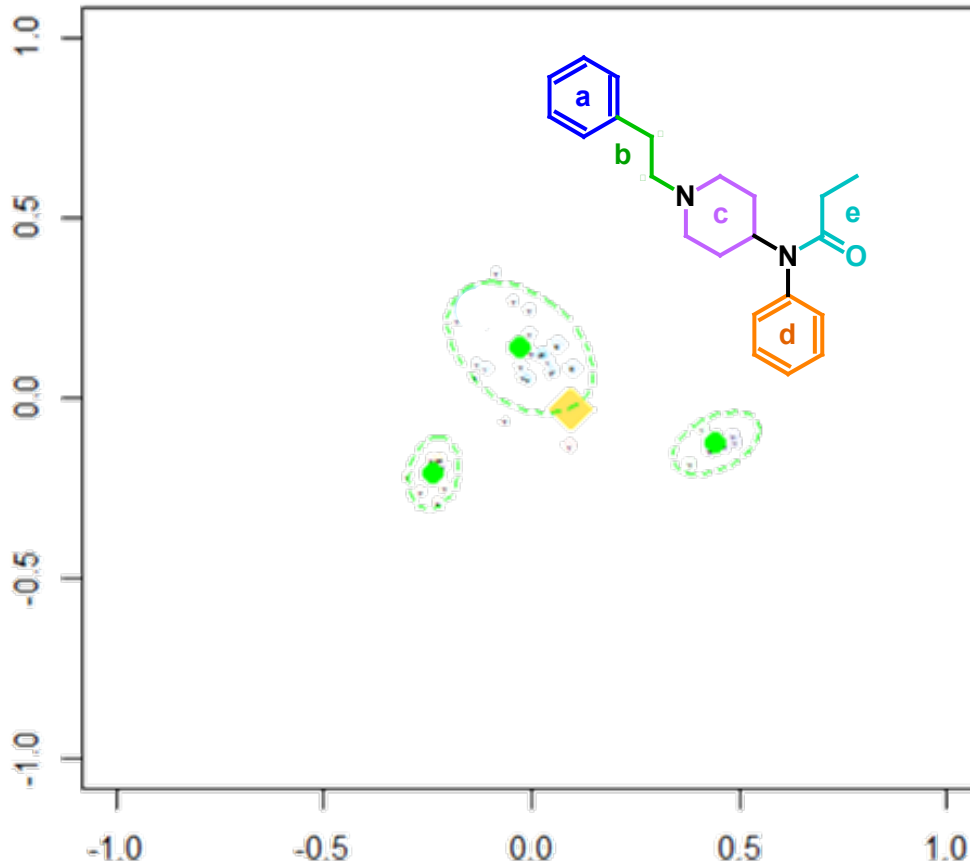
■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

Fentanyl ClassifieR (prototype)



■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

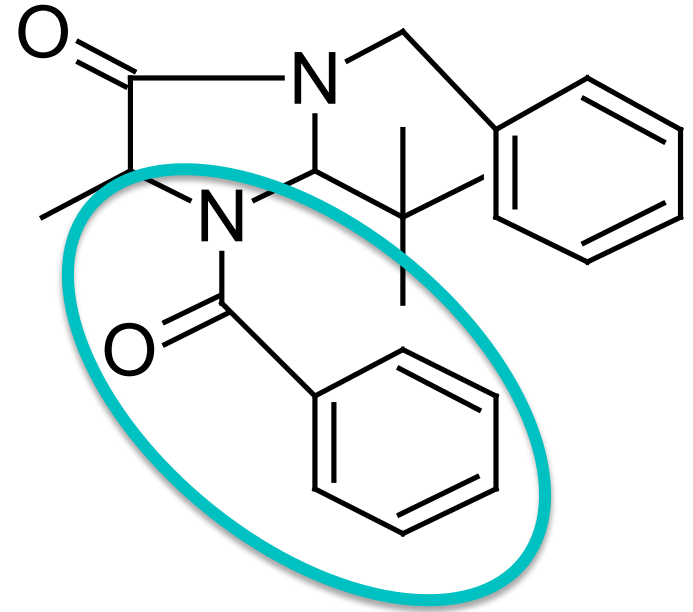
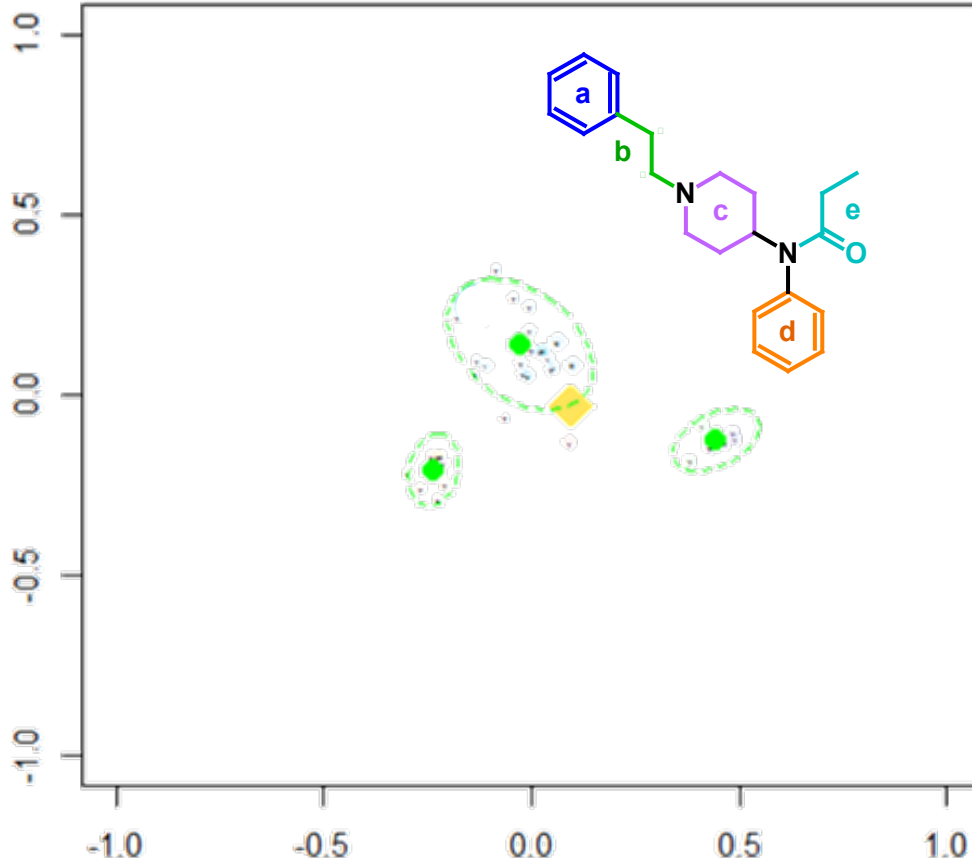
Fentanyl ClassifieR (prototype)



Compound	hMF	Δ_m	Relatedness Index
Cyclopropyl fentanyl – E	274	2	0.02
Valeryl fentanyl – E	268	-14	0.02
Fentanyl	212	14	0.02
Cyclohexyl fentanyl – E	211	-40	0.01
Pivaloyl fentanyl – E	208	-14	0.01

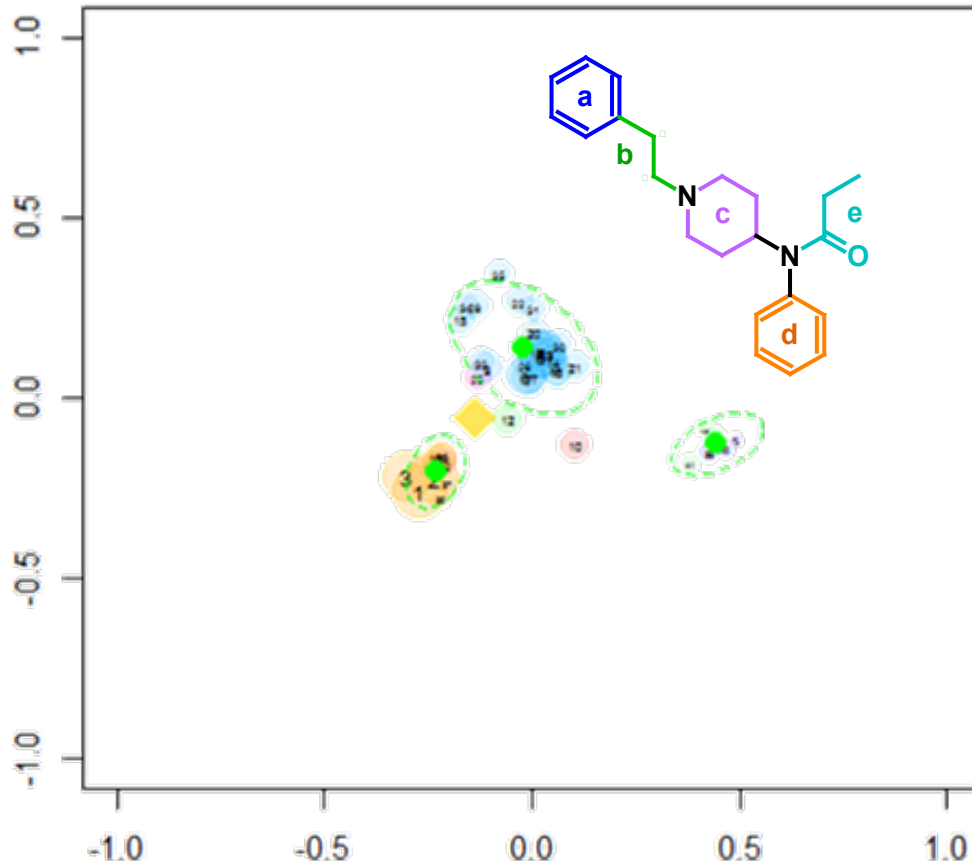
■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

Fentanyl ClassifieR (prototype)



■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

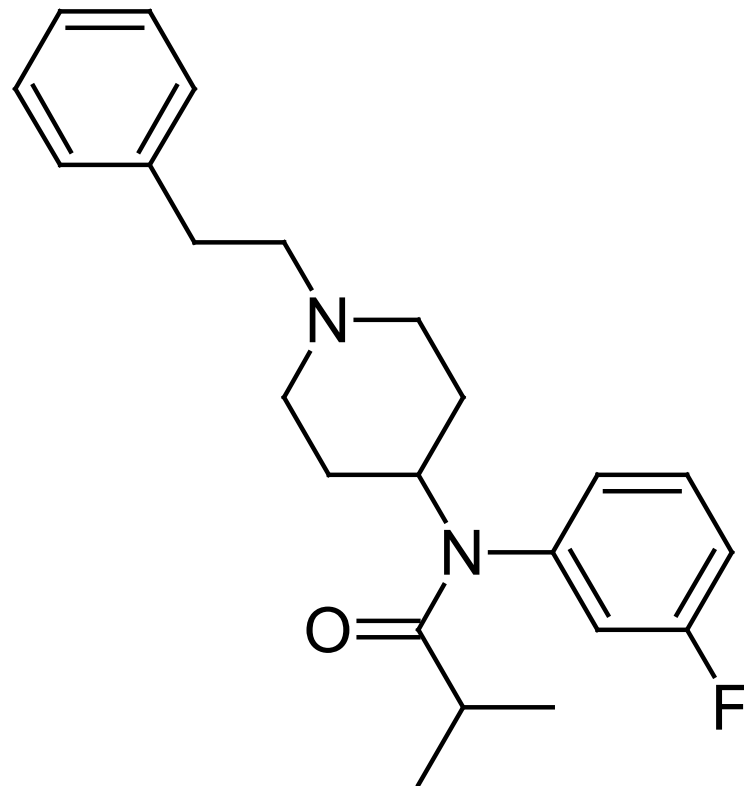
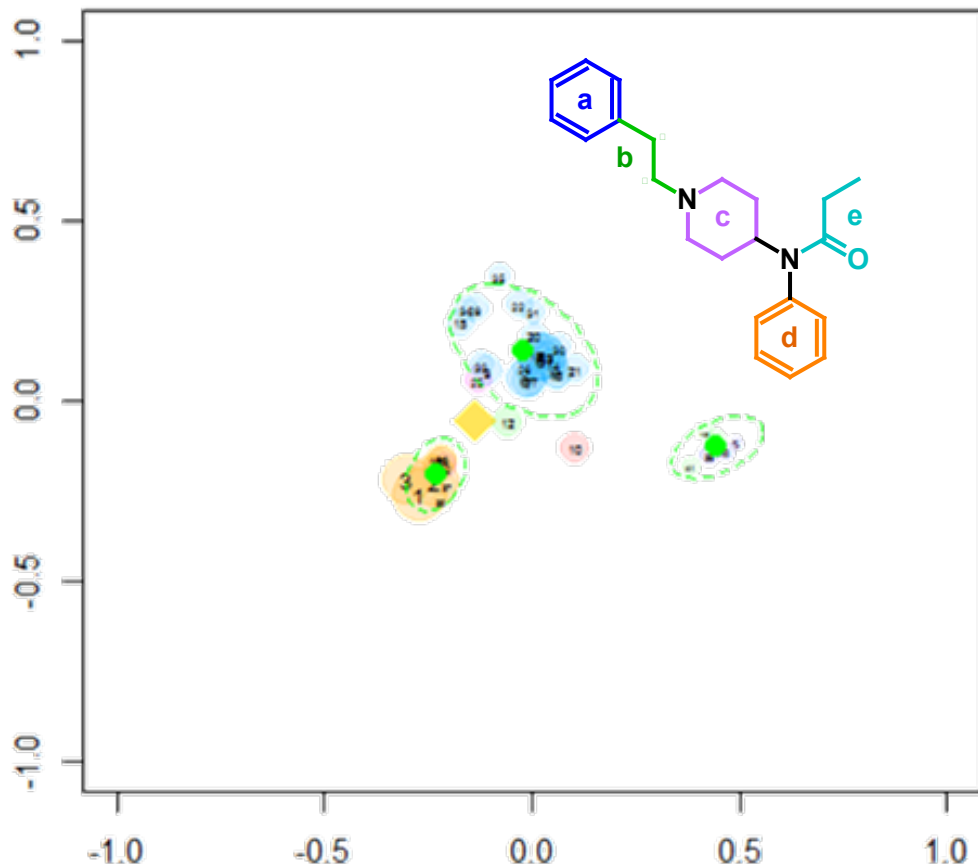
Fentanyl ClassifieR (prototype)



Compound	hMF	Δ_m	Relatedness Index
m-fluoro fentanyl – D	908	14	0.56
p-fluoro fentanyl – D	890	14	0.56
o-fluoro fentanyl – D	856	14	0.47
isobutyryl fentanyl – E	806	18	0.38
butyryl fentanyl – E	796	18	0.37

■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

Fentanyl ClassifieR (prototype)



■ Fentanyl ■ Mod. Type A ■ Mod. Type B ■ Mod. Type C ■ Mod. Type D ■ Mod. Type E

Can we extend this to other classes of drugs?

Questions?

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chemdata.nist.gov



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