

Adapting and adopting cheminformatics tools to support mapping chemical space coverage in non-targeted analysis

Charles N. Lowe¹, Gabrielle P. Black², Jon R. Sobus¹, and Antony J. Williams¹

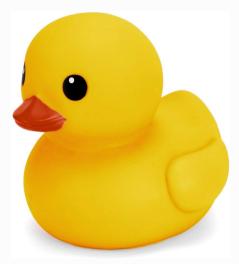
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- 2. Department of Civil & Environmental Engineering, University of California Davis, Davis, CA, USA



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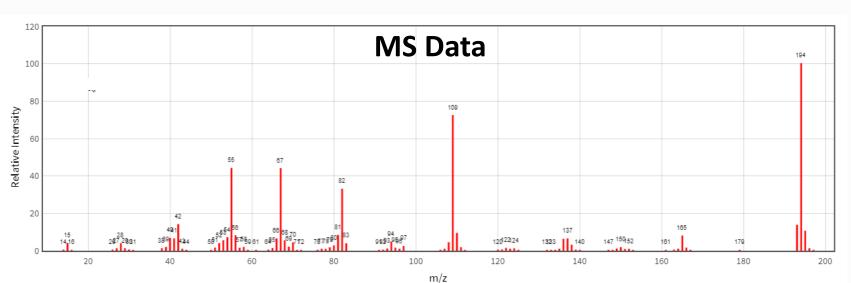
Non-targeted Analysis and Chemical Space



Media Sample



Extraction, Cleanup & Sample Preparation

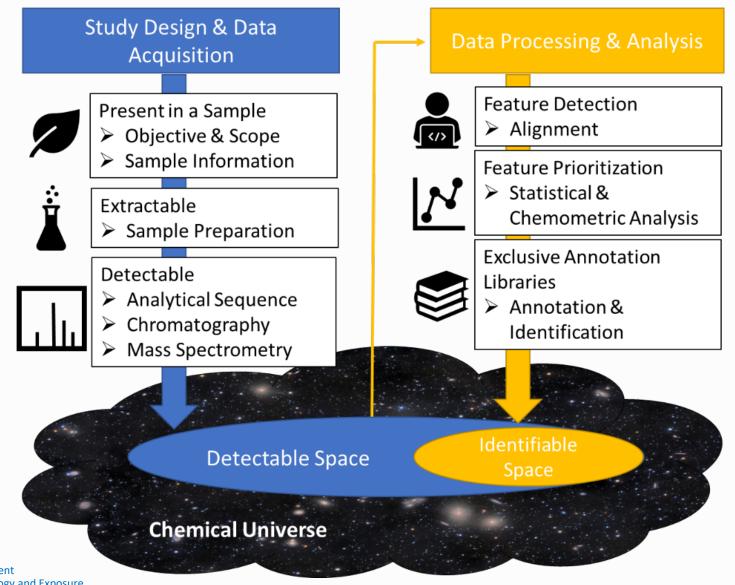


MS Analysis



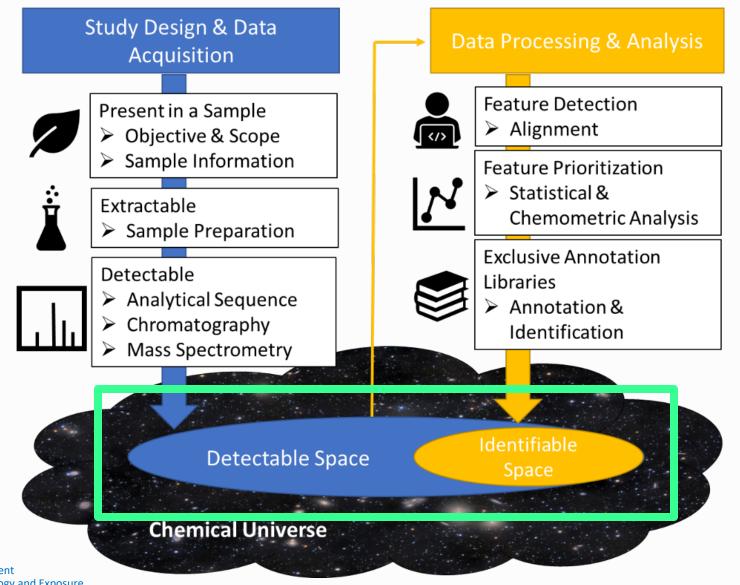


The chemical universe according to NTA



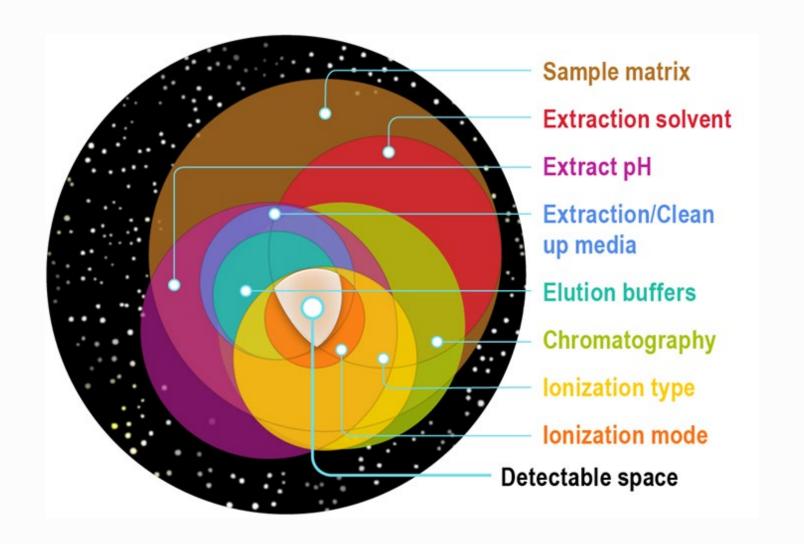


The chemical universe according to NTA



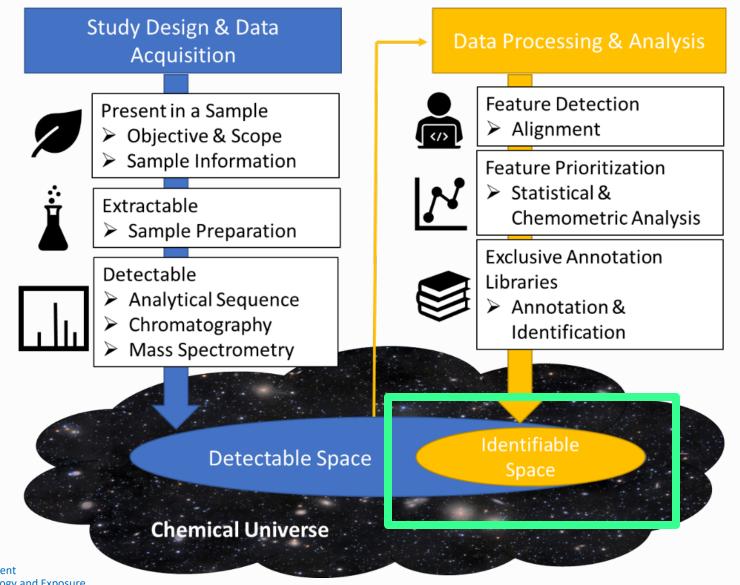


How to identify detectable space





The chemical universe according to NTA





Identifiable space

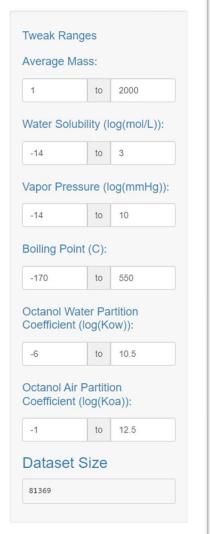
prediction. Predicted properties were obtained from OPERA

ChemSpace Tool

	Categories
(Consumer Products
(Drugs
(☐ Illicit Drugs
(Smoking&Vaping
(Pesticides
(Surfactants
	PFAS
(Food Products
(Hazardous Chemicals
(Dyes
(Plastics
(Water
(Halocarbons
(Phenois
(Exposome
(Metabolites
(Biosolids
(Biosolids QCMix
	≛ Download
	€ Reset Checkboxes

how	15 v entries							Search:		
	DTXSID \$	Preferred Name	CASRN \$	Molecular Formula	Average Mass	Water Solubility \$ (log(mol/L))	Vapor Pressure \$ (log(mmHg))	Boiling Point \$ (C)	Log(Kow) $\ensuremath{$\stackrel{\diamond}{=}$}$	Log(Koa)
1	DTXSID7021605	Hexanedioic acid	124-04-9	C6H10O4	146.14	-0.82	-6.5	337.44	0.08	7.59
2	DTXSID2020688	Hexachlorocyclopentadiene	77-47-4	C5CI6	272.76	-5.18	-1.22	238.99	5.04	6.91
3	DTXSID8021515	Butanoic acid	107-92-6	C4H8O2	88.11	-0.18	0.21	163.74	0.79	4.23
4	DTXSID6063199	2,4,5-T Triethanolamine salt	3813-14-7	C14H20Cl3NO6	404.67	-3.68	-4.43	314.38	0.79	9.06
5	DTXSID7020425	Dichlone	117-80-6	C10H4Cl2O2	227.04	-5.7	-5.95	346.15	2.15	7.38
6	DTXSID5020029	Acrylonitrile	107-13-1	C3H3N	53.06	0.15	2.03	77.43	0.25	2.44
7	DTXSID90866339	Butan-2-yl (2,4,5- trichlorophenoxy)acetate	61792-07- 2	C12H13Cl3O3	311.58	-4.27	-4.59	342.41	4.46	8.53
8	DTXSID3020964	Nitrobenzene	98-95-3	C6H5NO2	123.11	-1.79	-0.61	210.85	1.85	3.87
9	DTXSID7021100	Parathion	56-38-2	C10H14NO5PS	291.26	-4.36	-5.17	374.96	3.83	9.33
10	DTXSID1020306	Chloroform	67-66-3	CHCl3	119.37	-1.18	2.3	61.14	1.97	2.75
11	DTXSID5024057	Dimethylamine	124-40-3	C2H7N	45.08	1.56	3.18	6.9	-0.38	2.02
12	DTXSID1027007	Propanoic anhydride	123-62-6	C6H10O3	130.14	-0.26	0.13	169.94	0.58	3.92
13	DTXSID5021881	Ethylenediamine	107-15-3	C2H8N2	60.1	1.22	1.08	117.03	-2.04	6.7
14	DTXSID1020647	Furfural	98-01-1	C5H4O2	96.08	-0.1	0.34	153.4	0.41	3.50
15	DTXSID8041329	2,4,5-T 2-Ethylhexyl	1928-47-8	C16H21Cl3O3	367.69	-4.87	-5.92	326.76	5.15	9.89

Each chemical substance is present in at least one category. Each chemical substance maps to a single chemical structure for the purpose of property

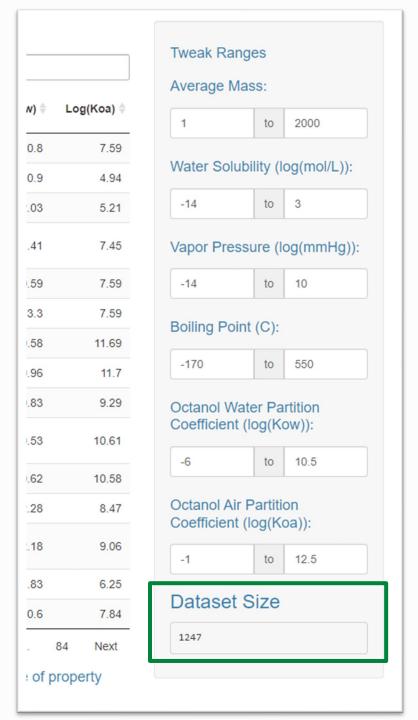




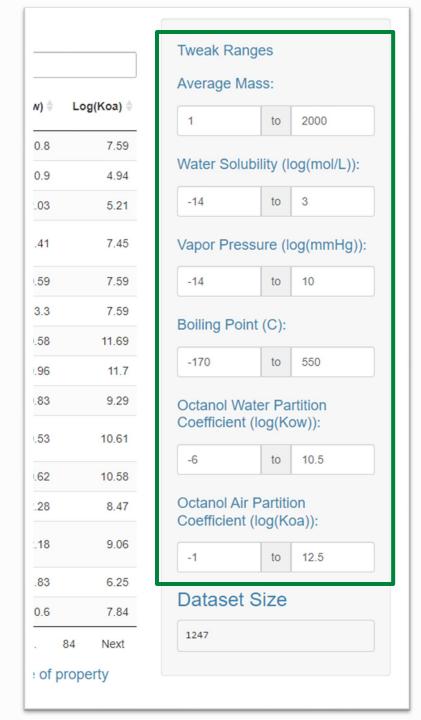
ChemSpace Tool Input Data Average Mass Water Solubility Categories Show 15 ∨ entries Consumer Products DTXSID **Preferred Name** Drugs ☐ Illicit Drugs DTXSID7021605 Hexanedioic acid ☐ Smoking&Vaping DTXSID2020688 Hexachlorocyclopentadiene Pesticides DTXSID8021515 Butanoic acid Surfactants DTXSID6063199 2,4,5-T Triethanolamine salt ☐ PFAS DTXSID7020425 Dichlone ☐ Food Products DTXSID5020029 Acrylonitrile ☐ Hazardous Chemicals Butan-2-yl (2,4,5-Dyes DTXSID90866339 trichlorophenoxy)acetate Plastics DTXSID3020964 Nitrobenzene □ Water DTXSID7021100 Parathion □ Halocarbons DTXSID1020306 Chloroform Phenols DTXSID5024057 Dimethylamine Exposome DTXSID1027007 Propanoic anhydride Metabolites Ethylenediamine DTXSID5021881 Biosolids Furfural DTXSID1020647 ☐ Biosolids QCMix 15 DTXSID8041329 2,4,5-T 2-Ethylhexyl ♣ Download Showing 1 to 15 of 81,369 entries C Reset Checkboxes Each chemical substance is present in at least

prediction. Predicted properties were obtained



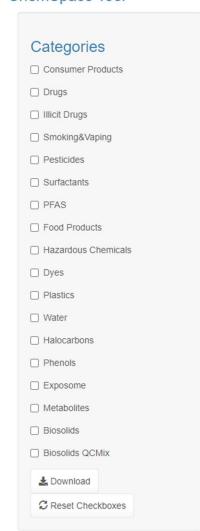


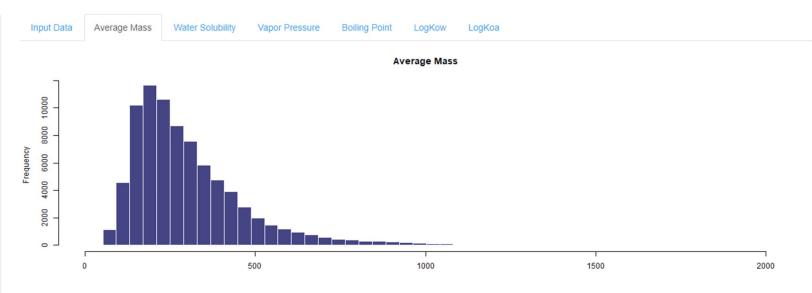




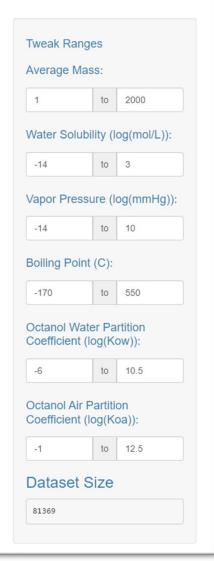


ChemSpace Tool



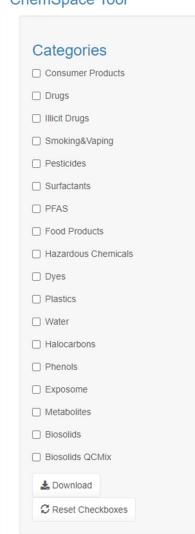


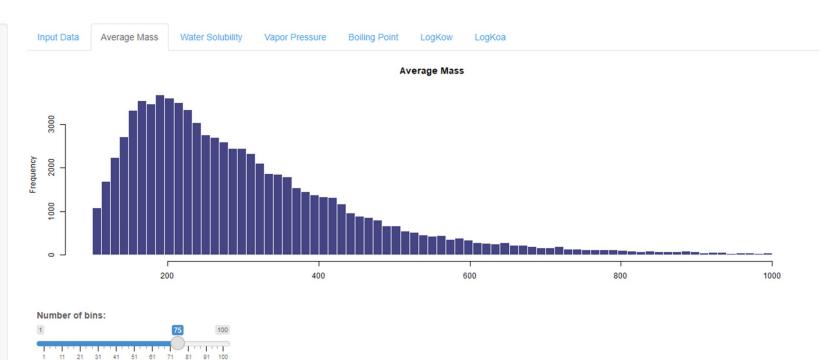


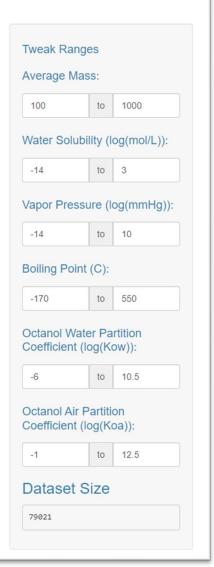




ChemSpace Tool

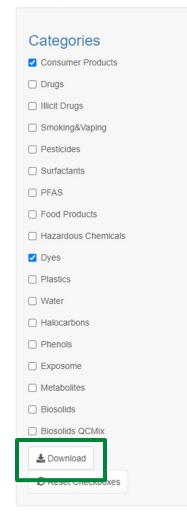


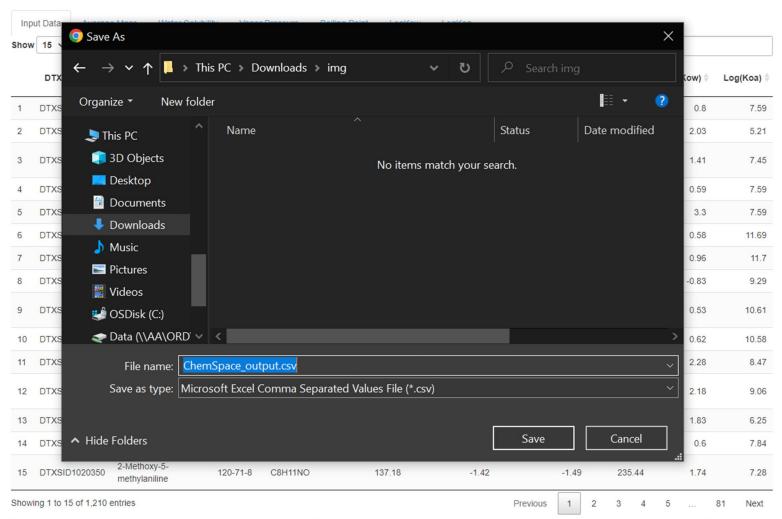






ChemSpace Tool





Tweak Ranges Average Mass: to 100 1000 Water Solubility (log(mol/L)): to 3 -14 Vapor Pressure (log(mmHg)): to 10 Boiling Point (C): to -170 550 Octanol Water Partition Coefficient (log(Kow)): to 10.5 Octanol Air Partition Coefficient (log(Koa)): 12.5 **Dataset Size** 1210

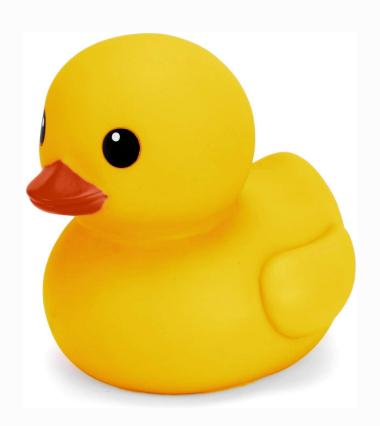
Each chemical substance is present in at least one category. Each chemical substance maps to a single chemical structure for the purpose of property prediction. Predicted properties were obtained from OPERA.



Downloadable dataset matching filter criteria

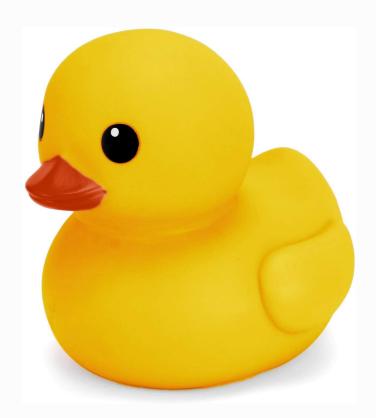
A	В	С	D	Е	F	G	Н	1	1	K	
		CASRN	INCHIKEY	SMILES	Molecular Formula	_	Water Solubility	Vapor Pressure	Boiling Point (Log(Koa)
2 DTXSID2021238		108-46-3	GHMLBKRAJCXXBS-UHFFFAOYSA-N	OC1=CC(C		110.11			279.96	0.8	7.59
3 DTXSID1021798	Quinoline	91-22-5	SMWDFEZZVXVKRB-UHFFFAOYSA-N	C1=CC2=C	C9H7N	129.16	-1.32	-1.22	237.23	2.03	5.21
4 DTXSID6025149	N,N-Dimethyl-p-phen	99-98-9	BZORFPDSXLZWJF-UHFFFAOYSA-N	CN(C)C1=0	C8H12N2	136.2	-0.99	-1.39	262.91	1.41	7.45
5 DTXSID7020716	Hydroquinone	123-31-9	QIGBRXMKCJKVMJ-UHFFFAOYSA-N	OC1=CC=C	C6H6O2	110.11	-0.18	-4.61	286.84	0.59	7.59
DTXSID6034972	Thymol	89-83-8	MGSRCZKZVOBKFT-UHFFFAOYSA-N	CC(C)C1=0	C10H14O	150.22	-2.26	-2.65	232.33	3.3	7.59
7 DTXSID1048700	Brilliant Green	633-03-4	NNBFNNNWANBMTI-UHFFFAOYSA-M	OS([O-])(=	C27H34N2O4S	482.64	-4.79	-7.68	365.26	0.58	11.69
B DTXSID5020653	Gentian Violet	548-62-9	ZXJXZNDDNMQXFV-UHFFFAOYSA-M	[CI-].CN(C	C25H30ClN3	407.99	-5.67	-7.69	353.08	0.96	11.7
9 DTXSID6021246	C.I. Basic Violet 14	632-99-5	NIKFYOSELWJIOF-SVFFXJIWSA-N	Cl.CC1=CC	C20H20ClN3	337.85	-2.17	-8.31	361.1	-0.83	9.29
0 DTXSID9020114	Auramine hydrochlori	2465-27-2	KSCQDDRPFHTIRL-UHFFFAOYSA-N	CI.CN(C)C	C17H22ClN3	303.83	-1.43	-6.69	330.53	0.53	10.61
1 DTXSID1025512	Malachite green	569-64-2	FDZZZRQASAIRJF-UHFFFAOYSA-M	[CI-].CN(C	C23H25ClN2	364.92	-5.11	-6.28	354.56	0.62	10.58
2 DTXSID2020921	2-Naphthylamine	91-59-8	JBIJLHTVPXGSAM-UHFFFAOYSA-N	NC1=CC2=	C10H9N	143.19	-2.88	-3.59	300.04	2.28	8.47
3 DTXSID5020867	4,4'-Methylenebis(o-t	838-88-0	WECDUOXQLAIPQW-UHFFFAOYSA-N	CC1=C(N)	C15H18N2	226.32	-2.86	-7.04	363.06	2.18	9.06
4 DTXSID9020295	4-Chloroaniline	106-47-8	QSNSCYSYFYORTR-UHFFFAOYSA-N	NC1=CC=C	C6H6CIN	127.57	-1.56	-1.56	231.92	1.83	6.25
5 DTXSID5041358	2,4-Diaminoanisole	615-05-4	BAHPQISAXRFLCL-UHFFFAOYSA-N	COC1=CC	C7H10N2O	138.17	-0.39	-3.11	221.2	0.6	7.84
6 DTXSID1020350	2-Methoxy-5-methyla	120-71-8	WXWCDTXEKCVRRO-UHFFFAOYSA-N	COC1=CC	C8H11NO	137.18	-1.42	-1.49	235.44	1.74	7.28
7 DTXSID1026164	2-Methylaniline	95-53-4	RNVCVTLRINQCPJ-UHFFFAOYSA-N	CC1=C(N)	C7H9N	107.16	-0.83	-0.59	220.67	1.32	5.91
8 DTXSID3025091	C.I. Disperse Black 6	119-90-4	JRBJSXQPQWSCCF-UHFFFAOYSA-N	COC1=CC	C14H16N2O2	244.29	-3.61	-8.33	356.03	1.81	9.11
9 DTXSID5023877	2-Anisidine	90-04-0	VMPITZXILSNTON-UHFFFAOYSA-N	COC1=CC	C7H9NO	123.16	-0.99	-1.1	224.5	1.18	6.15
0 DTXSID0021094	4,4'-Oxydianiline	101-80-4	HLBLWEWZXPIGSM-UHFFFAOYSA-N	NC1=CC=C	C12H12N2O	200.24	-2.71	-6.13	350.06	1.36	8.36
1 DTXSID9021344	4,4'-Thiodianiline	139-65-1	ICNFHJVPAJKPHW-UHFFFAOYSA-N	NC1=CC=C	C12H12N2S	216.3	-2.64	-6.17	360.98	2.18	9.03
		101-77-9	YBRVSVVVWCFQMG-UHFFFAOYSA-N	NC1=CC=C		198.27	-2.3	-5.48	397.84	1.59	8.38
← ChemSp	pace_output					: ∢)





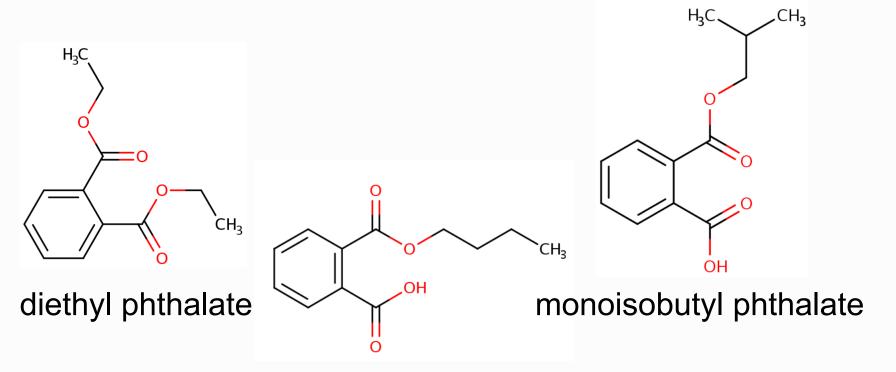


- ❖We would like to see if plasticizers(phthalates) are in our rubber ducky.
- We own an LC-MS instrument.
- \bullet We resolve a spectrum to a formula of $C_{12}H_{14}O_4$.
- ❖315 potential structures based on a search of the CompTox Chemicals Dashboard.
 - This is the entirety of our <u>identifiable space</u>.





A spectrum is resolved to $C_{12}H_{14}O_4$, which could match a many of the structures, including:



monobutyl phthalate

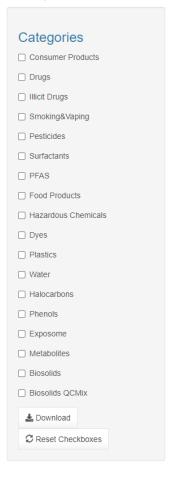
H₃C CH₃

diethyl terephthalate



A spectrum is resolved to $C_{12}H_{14}O_4$, which could match many structures, including:

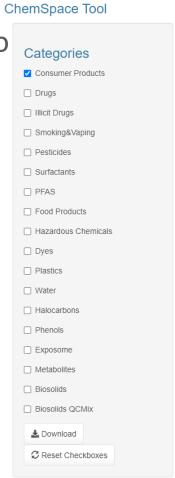
ChemSpace Tool



how 1	5 🗸 entries							Search:	C12H14O4	
	DTXSID	Preferred Name	CASRN ∜	Molecular Formula	Average Mass	Water Solubility $\prescript{$\phi$}$ (log(mol/L))	Vapor Pressure ≑ (log(mmHg))	Boiling Point (C)	Log(Kow) $\mbox{$\stackrel{+}{$}$}$	Log(Koa) 🏺
2742	DTXSID40214422	Salicylic acid, valerate	64206-54- 8	C12H14O4	222.24	-2.6	-6.21	304.79	2.34	9.04
4144	DTXSID40440007	2-Propen-1-one, 1-(3,4,5-trimethoxyphenyl)-	106331- 50-4	C12H14O4	222.24	-2.28	-4.55	294.81	1.38	7.26
8503	DTXSID5052701	Monoisobutyl phthalate	30833-53- 5	C12H14O4	222.24	-1.96	-6.1	304.08	2.37	9.28
14932	DTXSID4040002	Monobutyl phthalate	131-70-4	C12H14O4	222.24	-1.97	-6.21	304.76	2.37	9.04
17907	DTXSID7021780	Diethyl phthalate	84-66-2	C12H14O4	222.24	-2.33	-2.68	299.64	2.44	6.75
23298	DTXSID8060909	Diethyl terephthalate	636-09-9	C12H14O4	222.24	-2.67	-2.72	299.64	2.37	6.75
24833	DTXSID30232918	5-(IsopropyI)-4- methylphthalic acid	84029-87- 8	C12H14O4	222.24	-2.59	-5.92	317.77	2.47	8.14
25831	DTXSID40992258	Methyl (4-hydroxy-3- propanoylphenyl)acetate	71662-41- 4	C12H14O4	222.24	-1.73	-6.61	314.11	2.23	8.98
26323	DTXSID80221352	Ethyl 1,3-benzodioxole-5- propionate	7116-48-5	C12H14O4	222.24	-2.62	-4.26	283.39	2.14	7.55
26807	DTXSID00194019	Ethyl 3-oxo-4- phenoxybutyrate	41051-18- 7	C12H14O4	222.24	-1.85	-2.9	294.86	2.06	7.42
27717	DTXSID5062683	Benzenepropanoic acid, 4- methoxybetaoxo-, ethyl ester	2881-83-6	C12H14O4	222.24	-2.39	-2.77	294.97	2.22	7.42
28190	DTXSID20987268	But-2-yne-1,4-diyl bis(2- methylprop-2-enoate)	67905-43- 5	C12H14O4	222.24	-1.51	-2.56	256.74	1.87	5.72
28723	DTXSID1057826	Dimecrotic acid	7706-67-4	C12H14O4	222.24	-2.4	-4.67	306.33	2.31	9.04
30683	DTXSID50995538	2-Methylpropyl 2H-1,3- benzodioxole-5-carboxylate	74098-26- 3	C12H14O4	222.24	-2.82	-4.21	287.24	2.25	7.26
30831	DTXSID1044851	2-Hydroxy-3-phenoxypropyl prop-2-enoate	16969-10- 1	C12H14O4	222.24	-1.1	-5.24	314.25	2.15	9.22



A spectrum is resolved to $C_{12}H_{14}O_4$, which could match many structures, including:



how 1	5 🗸 entries							Search:	C12H14O4	2H14O4		
	DTXSID .	Preferred Name 💠	CASRN ≑	Molecular Formula	Average _	Water Solubility \$ (log(mol/L))	Vapor Pressure (log(mmHg))	Boiling Point (C)	Log(Kow) $=$	Log(Koa)		
3837	DTXSID5052701	Monoisobutyl phthalate	30833-53- 5	C12H14O4	222.24	-1.96	-6.1	304.08	2.37	9.28		
5914	DTXSID4040002	Monobutyl phthalate	131-70-4	C12H14O4	222.24	-1.97	-6.21	304.76	2.37	9.04		
6916	DTXSID7021780	Diethyl phthalate	84-66-2	C12H14O4	222.24	-2.33	-2.68	299.64	2.44	6.75		
8602	DTXSID8060909	Diethyl terephthalate	636-09-9	C12H14O4	222.24	-2.67	-2.72	299.64	2.37	6.75		
10208	DTXSID1057826	Dimecrotic acid	7706-67-4	C12H14O4	222.24	-2.4	-4.67	306.33	2.31	9.04		
10807	DTXSID1044851	2-Hydroxy-3- phenoxypropyl prop-2- enoate	16969-10- 1	C12H14O4	222.24	-1.1	-5.24	314.25	2.15	9.22		
11997	DTXSID5027277	1,3-Benzenedicarboxylic acid, diethyl ester	636-53-3	C12H14O4	222.24	-2.54	-2.72	299.64	2.33	6.75		
13115	DTXSID8063917	Piperonyl isobutyrate	5461-08-5	C12H14O4	222.24	-2.62	-4.2	287.24	2.14	7.26		
14844	DTXSID4041236	5-Allyl-4,7-dimethoxy- 1,3-benzodioxole	523-80-8	C12H14O4	222.24	-2.77	-4.53	289.5	1.02	7.25		
15064	DTXSID9047201	4-Formyl-2- methoxyphenyl isobutyrate	20665-85- 4	C12H14O4	222.24	-2.65	-2.35	285.64	2.24	7.23		
18205	DTXSID2020470	Diglycidyl resorcinol ether	101-90-6	C12H14O4	222.24	-2.42	-4.54	295.72	1.7	7.43		
18255	DTXSID20863735	1,2-Ethanediol, 1- phenyl-, 1,2-diacetate	6270-03-7	C12H14O4	222.24	-2.61	-2.77	289.68	2.27	6.9		
21764	DTXSID1047150	tert-Butyl hydrogen phthalate	33693-84- 4	C12H14O4	222.24	-1.97	-6.03	303.53	1.84	9.21		
26499	DTXSID80862007	Dill apiole	484-31-1	C12H14O4	222.24	-2.8	-4.53	289.5	1.03	7.25		



LC-MS amenability predictions can aid <u>detectable space</u>

Predicting compound amenability with liquid chromatography-mass spectrometry to improve nontargeted analysis

Charles N. Lowe [™], Kristin K. Isaacs, Andrew McEachran, Christopher M. Grulke, Jon R. Sobus, Elin M. Ulrich, Ann Richard, Alex Chao, John Wambaugh & Antony J. Williams

Analytical and Bioanalytical Chemistry 413, 7495–7508 (2021) Cite this article

488 Accesses 2 Citations 6 Altmetric Metrics

DTXSID	Preferred Name	SMILES	ESI+ Amenability	ESI+ Amenability Probability	ESI- Amenability	ESI- Amenability Probability
DTXSID5052701	Monoisobutyl phthalate	CC(C)COC	Amenable	0.566	Amenable	0.617
DTXSID4040002	Monobutyl phthalate	CCCCOC(=	Amenable	0.562	Amenable	0.551
DTXSID7021780	Diethyl phthalate	CCOC(=O)	Unamenable	0.326	Unamenable	0.141
DTXSID8060909	Diethyl terephthalate	CCOC(=O)	Unamenable	0.275	Unamenable	0.121
DTXSID1057826	Dimecrotic acid	COC1=CC(Amenable	0.759	Amenable	0.672
DTXSID1044851	2-Hydroxy-3-phenoxypropyl prop-2-enoate	OC(COC(=	Unamenable	0.256	Unamenable	0.159
DTXSID5027277	1,3-Benzenedicarboxylic acid, diethyl ester	CCOC(=O)	Unamenable	0.296	Unamenable	0.163
DTXSID8063917	Piperonyl isobutyrate	CC(C)C(=C	Unamenable	0.47	Unamenable	0.111
DTXSID4041236	5-Allyl-4,7-dimethoxy-1,3-benzodioxole	COC1=CC(Amenable	0.625	Unamenable	0.141
DTXSID9047201	4-Formyl-2-methoxyphenyl isobutyrate	COC1=C(C	Amenable	0.527	Unamenable	0.197
DTXSID2020470	Diglycidyl resorcinol ether	C(OC1=CC	Unamenable	0.373	Unamenable	0.134
DTXSID20863735	1,2-Ethanediol, 1-phenyl-, 1,2-diacetate	CC(=O)OC	Unamenable	0.418	Unamenable	0.161
DTXSID1047150	tert-Butyl hydrogen phthalate	CC(C)(C)O	Amenable	0.557	Amenable	0.619
DTXSID80862007	Dill apiole	COC1=C(C	Amenable	0.644	Unamenable	0.153



Conclusions

- Benefits of understanding coverage of chemical space in NTA
 - Reduced method development time
 - Improved structure annotation/prioritization
 - -Context for results based on chosen method
- Development of a ChemSpace Tool will continue in collaboration with analytical scientists
- A manuscript describing the vision of this tool has been submitted for peer review
 - A proof-of-concept tool is currently under development (which has been shown here)

