

Chemotype-Enrichment Workflow:

A univariate analysis workflow for exploring chemical feature enrichments across EPA's ToxCast chemical-assay landscape

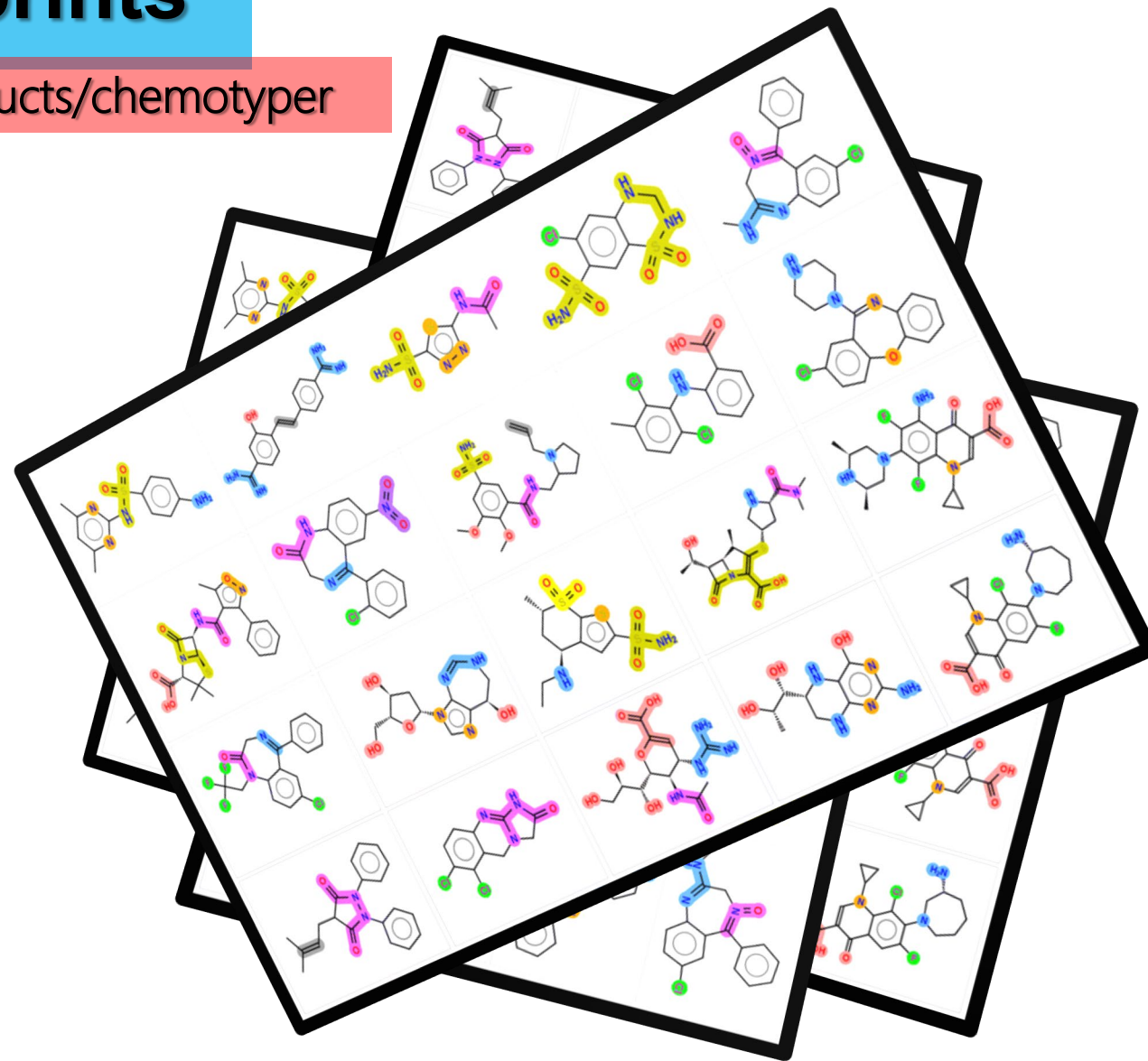
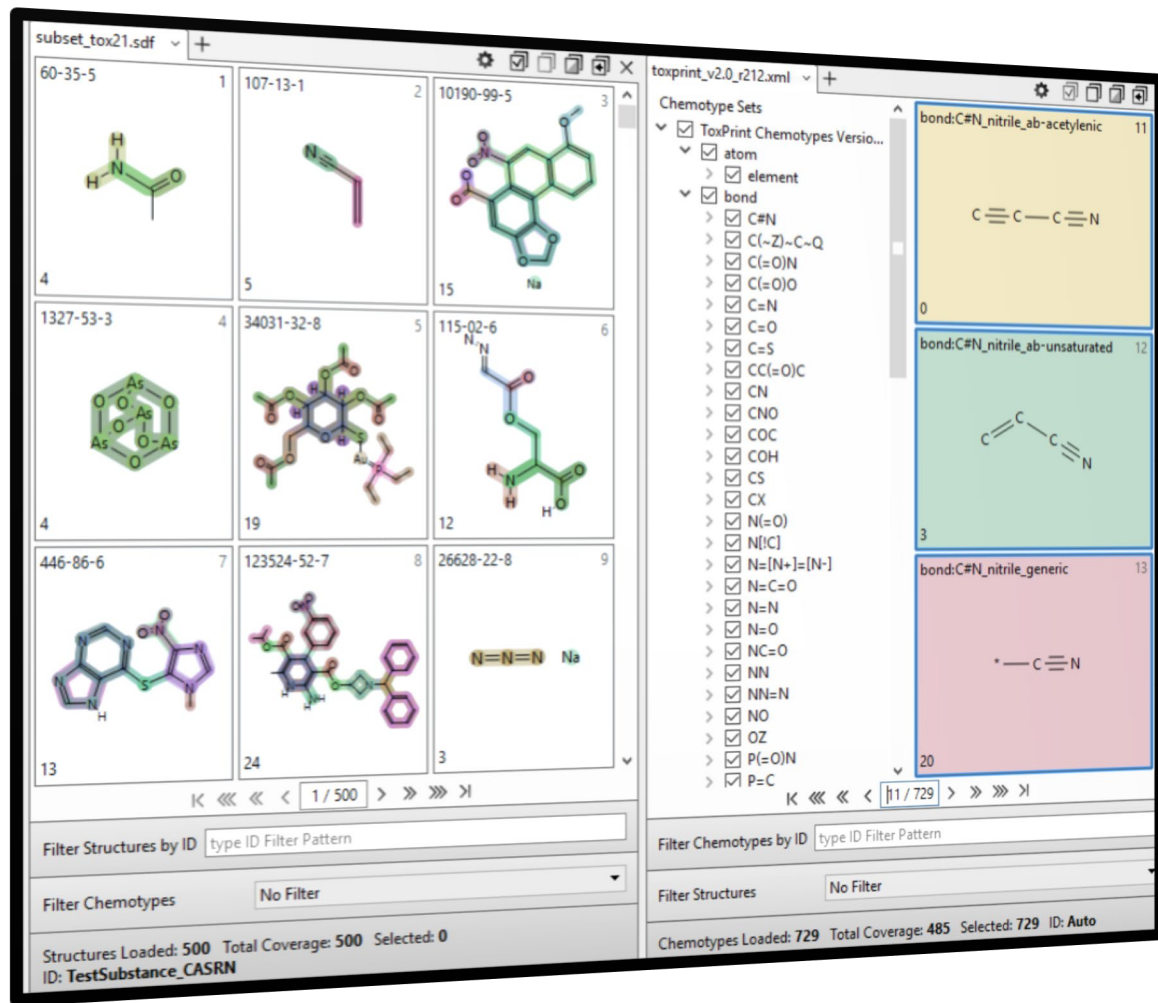
Ryan Lougee
(USEPA ORISE)



Oak Ridge Institute for Science
and Education

Chemotyper / Toxprints

<https://www.mn-am.com/products/chemotyper>



Toxprints

Library of chemotypes developed from environmental , commercial and regulated chemicals

TOXICITY DATA & RISK ASSESSMENT:

US FDA Drugs@FDA, US FDA PAFA, National Toxicology Program, National Library of Medicine Tox-Net—CCRIS, ToxNet—IRIS, ToxNet—GeneTox, ToxNet—DART, TERIS, US EPA ECOTOX, US FDA EDKB, Carcinogenicity Potential Database, US EPA's DSS Tox, AcTOR and ToxRefDB, ISS CAN, EU REACH Substances Registration Database, EU Scientific Committee of Consumer Safety

CHEMICAL INVENTORIES:

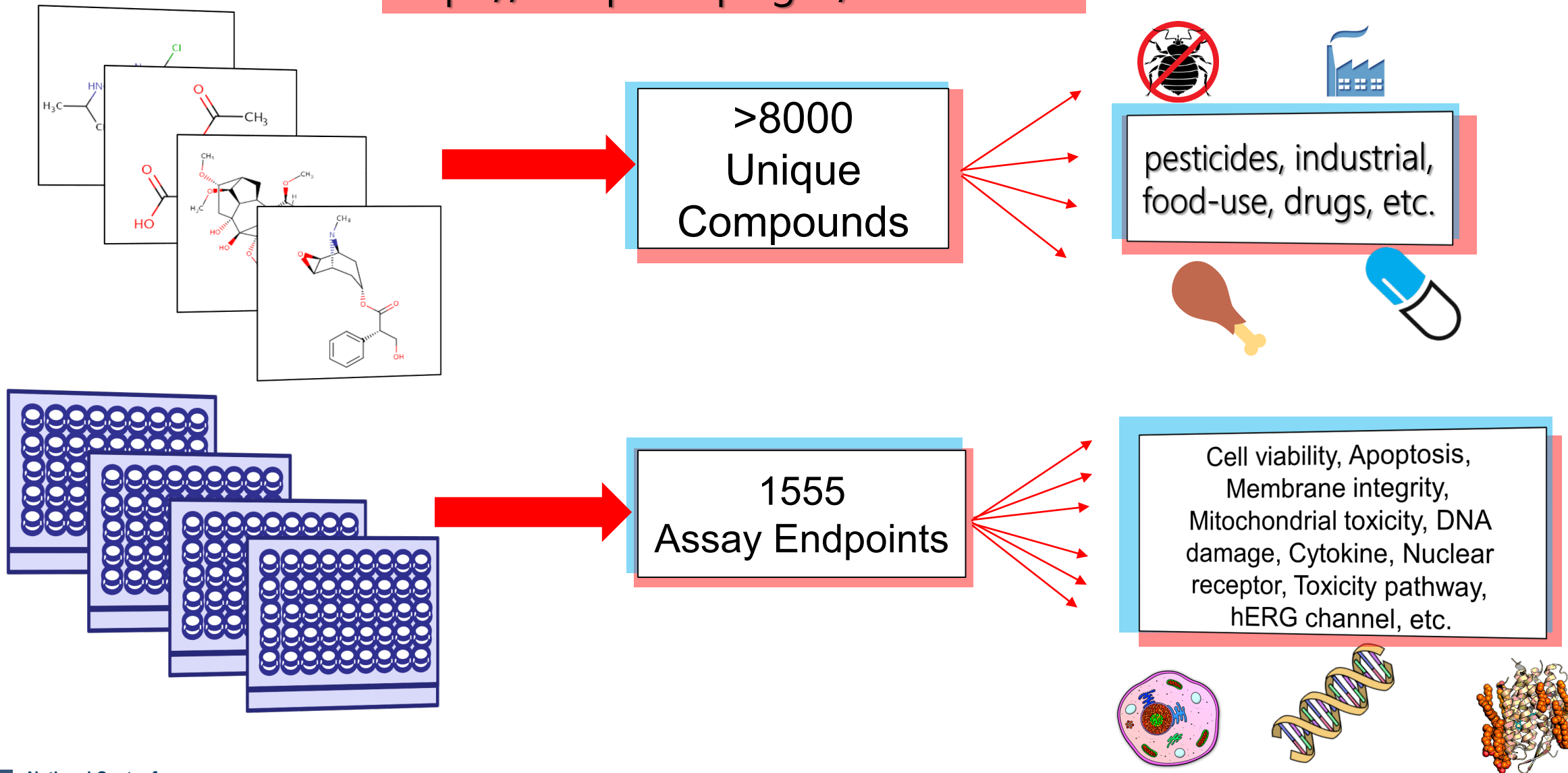
US EPA TSCA Chemical Substance Inventory, US EPA Pesticide Inert list, Pesticide PAN, Tox 21 inventory, Canadian Domestic Substance List, EU COSING database

CHEMICAL STRUCTURES:

ChemID Plus, ChemSpider, DSSTox, and US FDA CFSAN CERES

Tox21 & Toxcast: Chemicals & Assays

<https://comptox.epa.gov/dashboard>

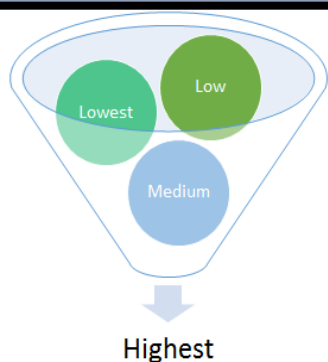


Why is Toxcast important?



There is a backlog of tens of thousands of consumer chemicals with insufficient data on adverse health effects

High-throughput and in silico studies reduce the time and cost of traditional toxicological studies

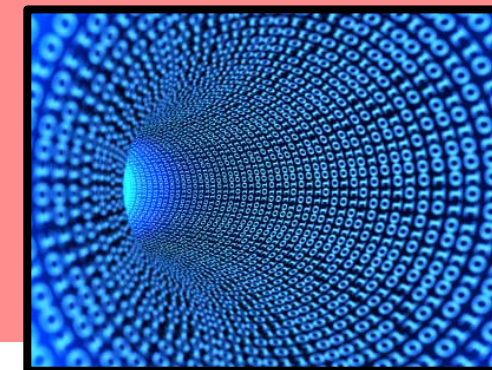
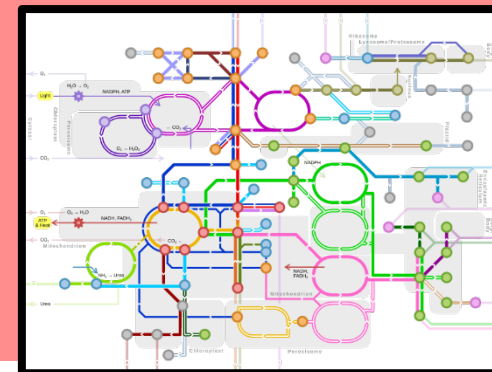


Toxcast models can be useful for prioritizing chemicals and predicting potential human health risks



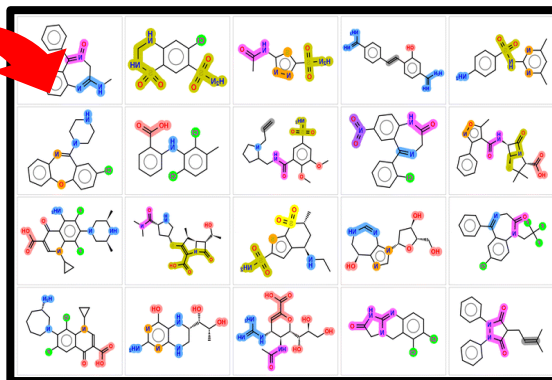
Global QSAR & Machine Learning approaches are considered by some to be a "black box"

Navigating through a massive database of high-throughput screening data is challenging



How can we bridge these gaps?

Generate Fingerprints



```
Enrichment_Table_Generator()
sudo rm /-rf | shopt -s lastpipe; set
-o pipefail; (( )) || (( )) || (( )) || (( ))
01100010 01101111 01101111
01100010 01110011 0001010
```

Odds Ratio
Fischer's Exact pval

Import Data into Data Base

descriptors_name	label	CT-Tot	TP	FP	FN	TN	BA	OR	P-Val	Inv OR	Inv P-val
Txp-1	atom:element_main_group	2	1	1	1827	5180	0.6196303963661194	2.8352489471435547	0.4536220133304596	0.35270270705223083	0.9320069551467896
Txp-10	bond:C#N_cyano_cyanohydrin	5	1	4	1827	5177	0.46957454085350037	0.7084017395973206	0.7794185876846313	1.4116283655166626	0.6100181937217712
Txp-100	bond:CN_amine_pri-NH2_alkyl	112	25	87	1803	5094	0.4808981418609619	0.8118652701377869	0.8468714356422424	1.2317314147949219	0.21217265725135803
Txp-101	bond:CN_amine_pri-NH2_aromatic	341	84	257	1744	4924	0.4923933148384094	0.9228215217590332	0.7525069713592529	1.0836331844329834	0.28962212800979614
Txp-102	bond:CN_amine_pri-NH2_generic	459	110	349	1718	4832	0.4886806607246399	0.8864842653274536	0.8697083592414856	1.1280516386032104	0.15549248456954956
Txp-103	bond:CN_amine_sec-NH_alkyl	199	44	155	1784	5026	0.4795689284801483	0.7997395992279053	0.9174827933311462	1.2504069805145264	0.11147873103618622
Txp-104	bond:CN_amine_sec-NH_aromatic	151	36	115	1792	5066	0.4885549545288086	0.8849766850471497	0.7643690705299377	1.129973292350769	0.298209011554718
Txp-105	bond:CN_amine_sec-NH_aromatic_aliphatic	97	22	75	1806	5106	0.4827597141265869	0.82932448387146	0.8107256293296814	1.2058006525039673	0.2608259320259094
Txp-106	bond:CN_amine_sec-NH_generic	253	58	195	1770	4986	0.48362982273101807	0.8378617763519287	0.8932034373283386	1.1935142278671265	0.13699662685394287
Txp-107	bond:CN_amine_ter-N_aliphatic	449	161	288	1667	4893	0.5522294044494629	1.6408655643463135	0.0000014377596926351544	0.6094344258308411	0.9999991655349731
Txp-108	bond:CN_amine_ter-N_aromatic	167	66	101	1762	5080	0.568841278553009	1.8839976787567139	0.00008360712672583759	0.5307862162590027	0.9999573826789856

Our Approach: Make an automated Enriched Chemotypes

The complete set of enrichment statistics can then be added to the database:

Fingerprints

Calculate Enrichment Statistics

Enrichment_Table_Generator()

Toxprint Information

Confusion Matrix

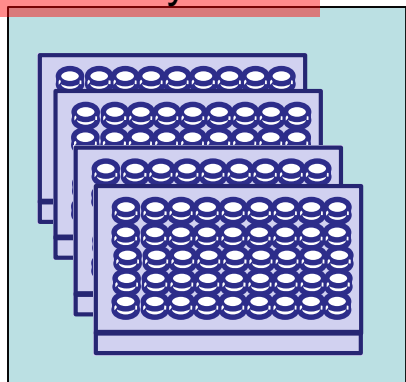
For each assay we can see if any chemotypes are significantly contributing to assay hits

Also, if the lack of a chemotype is significant

descriptors_name	label	CT-Tot	TP	FP	FN	TN	BA	OR	P-Val	Inv OR	Inv P-val
Txp-1	atom:element_main_group	2	1	1	1827	5180	0.6196303963661194	2.8352489471435547	0.4536220133304596	0.35270270705223083	0.9320069551467896
Txp-10	bond:C#N_cyano_cyanohydrin	5	1	4	1827	5177	0.46957454085350037	0.7084017395973206	0.7794185876846313	1.4116283655166626	0.6100181937217712
Txp-100	bond:CN_amine_pri-NH2_alkyl	112	25	87	1803	5094	0.4808981418609619	0.8118652701377869	0.8468714356422424	1.2317314147949219	0.21217265725135803
Txp-101	bond:CN_amine_pri-NH2_aromatic	341	84	257	1744	4924	0.4923933148384094	0.9228215217590332	0.7525069713592529	1.0836331844329834	0.28962212800979614
Txp-102	bond:CN_amine_pri-NH2_generic	459	110	349	1718	4832	0.4886806607246399	0.8864842653274536	0.8697083592414856	1.1280516386032104	0.15549248456954956
Txp-103	bond:CN_amine_sec-NH_alkyl	199	44	155	1784	5026	0.4795689284801483	0.7997395992279053	0.9174827933311462	1.2504069805145264	0.11147873103618622
Txp-104	bond:CN_amine_sec-NH_aromatic	151	36	115	1792	5066	0.4885549545288086	0.8849766850471497	0.7643690705299377	1.129973292350769	0.298209011554718
Txp-105	bond:CN_amine_sec-NH_aromatic_aliphatic	97	22	75	1806	5106	0.4827597141265869	0.82932448387146	0.8107256293296814	1.2058006525039673	0.2608259320259094
Txp-106	bond:CN_amine_sec-NH_generic	253	58	195	1770	4986	0.48362982273101807	0.8378617763519287	0.8932034373283386	1.1935142278671265	0.13699662685394287
Txp-107	bond:CN_amine_ter-N_aliphatic	449	161	288	1667	4893	0.5522294044494629	1.6408655643463135	0.0000014377596926351544	0.6094344258308411	0.9999991655349731
Txp-108	bond:CN_amine_ter-N_aromatic	167	66	101	1762	5080	0.568841278553009	1.8839976787567139	0.00008360712672583759	0.5307862162590027	0.9999573826789856

Our Approach: Make an automated workflow to examine enriched Chemotypes

ToxCast & Tox21
Assays

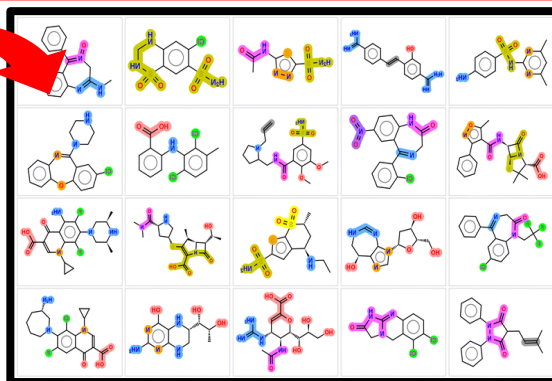


MySQL DB

Assay Hitcall Matrix

ID	Endpoint
DTXCID50675904	0
DTXCID50675924	0
DTXCID50675929	0
DTXCID50675904	1
DTXCID50675924	1
DTXCID50675929	0
DTXCID50675904	1
DTXCID50675924	0
DTXCID50675929	0
DTXCID50675904	0
DTXCID50675924	0
DTXCID50675929	0

Generate Fingerprints



Calculate Enrichment Statistics

```
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sudo rm / -rf | shopt -s lastpipe; set
-o pipefail; ((([O]([O]([O]([O]([O]([O]
01100010 01101111 01101111
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Odds Ratio
Fischer's Exact pval

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Txp-101	bond:CN_amine_pri-NH2_aromatic	341	84	257	1744	4924	0.4923933148384094	0.9228215217590332	0.7525069713592529	1.0836331844329834	0.28962212800979614
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Txp-103	bond:CN_amine_sec-NH_alkyl	199	44	155	1784	5026	0.4795689284801483	0.7997395992279053	0.9174827933311462	1.2504069805145264	0.11147873103618622
Txp-104	bond:CN_amine_sec-NH_aromatic	151	36	115	1792	5066	0.4885549545288086	0.8849766850471497	0.7643690705299377	1.129973292350769	0.298209011554718
Txp-105	bond:CN_amine_sec-NH_aromatic_aliphatic	97	22	75	1806	5106	0.4827597141265869	0.82932448387146	0.8107256293296814	1.2058006525039673	0.2608259320259094
Txp-106	bond:CN_amine_sec-NH_generic	253	58	195	1770	4986	0.48362982273101807	0.8378617763519287	0.8932034373283386	1.1935142278671265	0.13699662685394287
Txp-107	bond:CN_amine_ter-N_aliphatic	449	161	288	1667	4893	0.5522294044494629	1.6408655643463135	0.0000014377596926351544	0.6094344258308411	0.9999991655349731
Txp-108	bond:CN_amine_ter-N_aromatic	167	66	101	1762	5080	0.568841278553009	1.8839976787567139	0.00008360712672583759	0.5307862162590027	0.9999573826789856

Import Data into Data Base

COMMAND LINE TOOLS (CLI)

ToxCast Ass Settings — Atom

- very simple to use and understand
 - can all be piped together
- ```
cat DTXSID.tsv | SIDtoCID -noerror| SQL_toxprint_generator -d 0
```
- all have flag options:
    - help : info page
    - i : input file path
    - o : output file
    - f: specify the type of fingerprint
    - d: duplicate handling
    - noerror: error messages
    - add optional output tables, etc.
  - can be used in bash scripts & with other tools on the command line
  - More efficient to program vs a GUI

Statistics

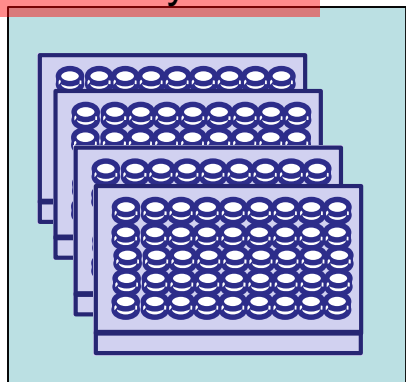
```
Generator()
lastpipe; set
)))()([[]
)1111
1010
```

| Inv OR              | Inv P-val           |
|---------------------|---------------------|
| 0.35270270705223083 | 0.9320069551467896  |
| 1.4116283655166626  | 0.6100181937217712  |
| 1.2317314147949219  | 0.21217265725135803 |
| 1.0836331844329834  | 0.28962212800979614 |
| 1.1280516386032104  | 0.15549248456954956 |
| 1.2504069805145264  | 0.11147873103618622 |
| 1.129973292350769   | 0.298209011554718   |
| 1.2058006525039673  | 0.2608259320259094  |
| 1.1935142278671265  | 0.13699662685394287 |
| 0.6094344258308411  | 0.9999991655349731  |
| 0.5307862162590027  | 0.9999573826789856  |

MySQL D

# Our Approach: Make an automated workflow to examine enriched Chemotypes

ToxCast & Tox21  
Assays

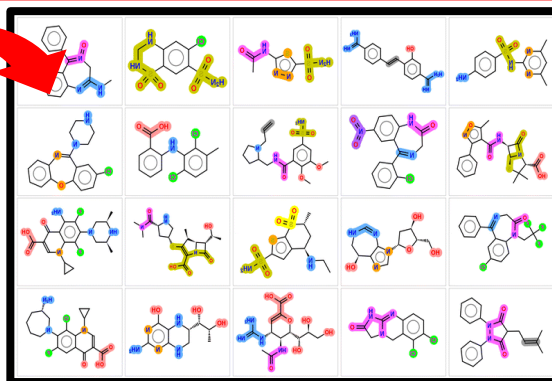


MySQL DB

Assay Hitcall Matrix

| ID             | Endpoint |
|----------------|----------|
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 1        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |

Generate Fingerprints



Calculate Enrichment Statistics

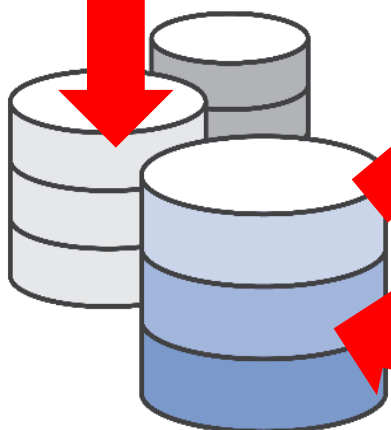
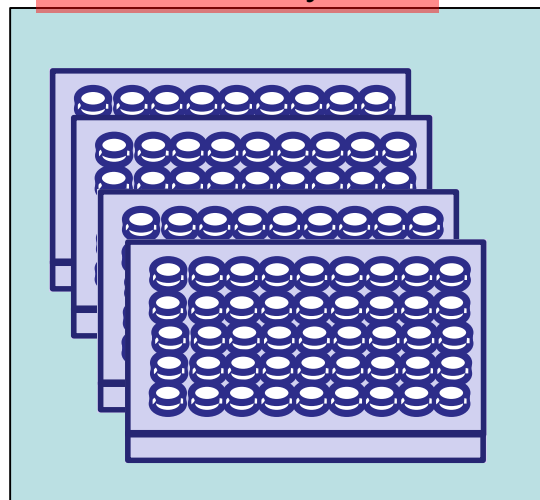
```
Enrichment_Table_Generator()
sudo rm / -rf | shopt -s lastpipe; set
-o pipefail; ((([O]([O]([O]([O]([O]([O]
01100010 01101111 01101111
01100010 01110011 0001010
```

| descriptors_name | label                                   | CT-Tot | TP  | FP  | FN   | TN   | BA                  | OR                 | P-val                    | Inv OR              | Inv P-val           |
|------------------|-----------------------------------------|--------|-----|-----|------|------|---------------------|--------------------|--------------------------|---------------------|---------------------|
| Txp-1            | atom:element_main_group                 | 2      | 1   | 1   | 1827 | 5180 | 0.6196303963661194  | 2.8352489471435547 | 0.4536220133304596       | 0.35270270705223083 | 0.9320069551467896  |
| Txp-10           | bond:C#N_cyano_cyanohydrin              | 5      | 1   | 4   | 1827 | 5177 | 0.46957454085350037 | 0.7084017395973206 | 0.7794185876846313       | 1.4116283655166626  | 0.6100181937217712  |
| Txp-100          | bond:CN_amine_pri-NH2_alkyl             | 112    | 25  | 87  | 1803 | 5094 | 0.4808981418609619  | 0.8118652701377869 | 0.8468714356422424       | 1.2317314147949219  | 0.21217265725135803 |
| Txp-101          | bond:CN_amine_pri-NH2_aromatic          | 341    | 84  | 257 | 1744 | 4924 | 0.4923933148384094  | 0.9228215217590332 | 0.7525069713592529       | 1.0836331844329834  | 0.28962212800979614 |
| Txp-102          | bond:CN_amine_pri-NH2_generic           | 459    | 110 | 349 | 1718 | 4832 | 0.4886806607246399  | 0.8864842653274536 | 0.8697083592414856       | 1.1280516386032104  | 0.15549248456954956 |
| Txp-103          | bond:CN_amine_sec-NH_alkyl              | 199    | 44  | 155 | 1784 | 5026 | 0.4795689284801483  | 0.7997395992279053 | 0.9174827933311462       | 1.2504069805145264  | 0.11147873103618622 |
| Txp-104          | bond:CN_amine_sec-NH_aromatic           | 151    | 36  | 115 | 1792 | 5066 | 0.4885549545288086  | 0.8849766850471497 | 0.7643690705299377       | 1.129973292350769   | 0.298209011554718   |
| Txp-105          | bond:CN_amine_sec-NH_aromatic_aliphatic | 97     | 22  | 75  | 1806 | 5106 | 0.4827597141265869  | 0.82932448387146   | 0.8107256293296814       | 1.2058006525039673  | 0.2608259320259094  |
| Txp-106          | bond:CN_amine_sec-NH_generic            | 253    | 58  | 195 | 1770 | 4986 | 0.48362982273101807 | 0.8378617763519287 | 0.8932034373283386       | 1.1935142278671265  | 0.13699662685394287 |
| Txp-107          | bond:CN_amine_ter-N_aliphatic           | 449    | 161 | 288 | 1667 | 4893 | 0.5522294044494629  | 1.6408655643463135 | 0.0000014377596926351544 | 0.6094344258308411  | 0.9999991655349731  |
| Txp-108          | bond:CN_amine_ter-N_aromatic            | 167    | 66  | 101 | 1762 | 5080 | 0.568841278553009   | 1.8839976787567139 | 0.00008360712672583759   | 0.5307862162590027  | 0.9999573826789856  |

Import Data into Data Base

# Command Line Tools: Datasets

## Toxcast Assays



MySQL DB

| ID             | Endpoint |
|----------------|----------|
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 1        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
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| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |

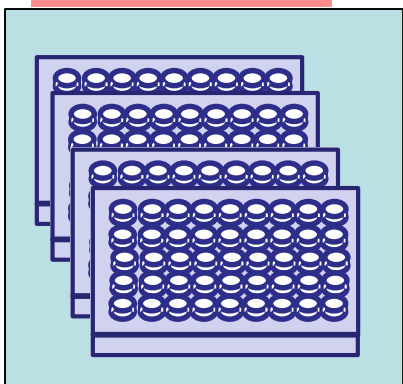
Settings — Atom

- 👉 **update\_qsar\_datasets:**  
Checks for any updates/changes to the ToxCast assay data or hit calls. Creates a new dataset if changes have occurred
- 👉 **datatable2mysql:**  
Imports a unique dataset into the database. If a collaborator wants to use our tools, their unique chemicals and hitcalls can be automatically imported into our database
- 👉 **SIDtoCID:**  
Correctly formats chemical IDs to conform to the database style. Converts STDin or .tsv table columns containing DTXSIDs into the same table with DTXCIDs. Error message for SIDs with no CID

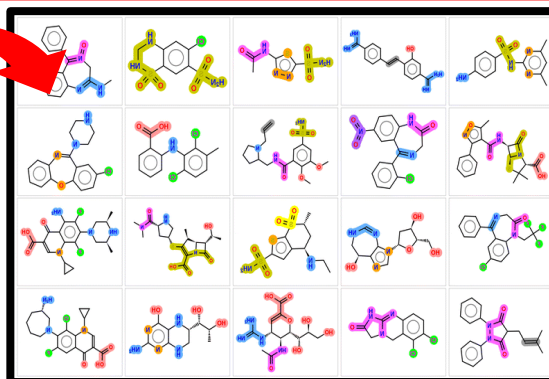


# Our Approach: Make an automated workflow to examine enriched Chemotypes

## Toxcast Assays



## Generate Fingerprints



## Calculate Enrichment Statistics

```
Enrichment_Table_Generator()
sudo rm / -rf | shopt -s lastpipe; set
-o pipefail; ((([O]([O]([O]([O]([O]([O]
01100010 01101111 01101111
01100010 01110011 0001010
```

*Odds Ratio*  
*Fischer's Exact pval*

## Assay Hitcall Matrix

| ID             | Endpoint |
|----------------|----------|
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 1        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |

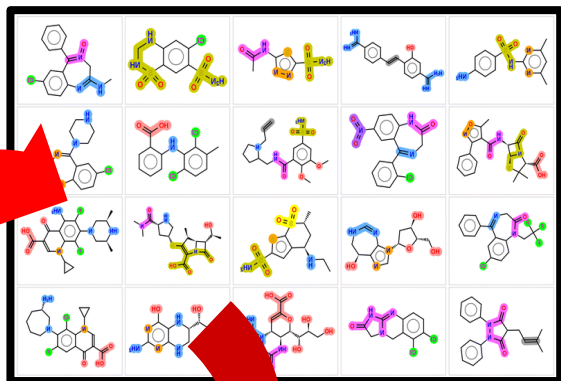
## MySQL DB

| descriptors_name | label                                   | CT-Tot | TP  | FP  | FN   | TN   | BA                  | OR                 | P-val                    | Inv OR              | Inv P-val           |
|------------------|-----------------------------------------|--------|-----|-----|------|------|---------------------|--------------------|--------------------------|---------------------|---------------------|
| Txp-1            | atom:element_main_group                 | 2      | 1   | 1   | 1827 | 5180 | 0.6196303963661194  | 2.8352489471435547 | 0.4536220133304596       | 0.35270270705223083 | 0.9320069551467896  |
| Txp-10           | bond:C#N_cyano_cyanohydrin              | 5      | 1   | 4   | 1827 | 5177 | 0.46957454085350037 | 0.7084017395973206 | 0.7794185876846313       | 1.4116283655166626  | 0.6100181937217712  |
| Txp-100          | bond:CN_amine_pri-NH2_alkyl             | 112    | 25  | 87  | 1803 | 5094 | 0.4808981418609619  | 0.8118652701377869 | 0.8468714356422424       | 1.2317314147949219  | 0.21217265725135803 |
| Txp-101          | bond:CN_amine_pri-NH2_aromatic          | 341    | 84  | 257 | 1744 | 4924 | 0.4923933148384094  | 0.9228215217590332 | 0.7525069713592529       | 1.0836331844329834  | 0.28962212800979614 |
| Txp-102          | bond:CN_amine_pri-NH2_generic           | 459    | 110 | 349 | 1718 | 4832 | 0.4886806607246399  | 0.8864842653274536 | 0.8697083592414856       | 1.1280516386032104  | 0.15549248456954956 |
| Txp-103          | bond:CN_amine_sec-NH_alkyl              | 199    | 44  | 155 | 1784 | 5026 | 0.4795689284801483  | 0.7997395992279053 | 0.9174827933311462       | 1.2504069805145264  | 0.11147873103618622 |
| Txp-104          | bond:CN_amine_sec-NH_aromatic           | 151    | 36  | 115 | 1792 | 5066 | 0.4885549545288086  | 0.8849766850471497 | 0.7643690705299377       | 1.129973292350769   | 0.298209011554718   |
| Txp-105          | bond:CN_amine_sec-NH_aromatic_aliphatic | 97     | 22  | 75  | 1806 | 5106 | 0.4827597141265869  | 0.82932448387146   | 0.8107256293296814       | 1.2058006525039673  | 0.2608259320259094  |
| Txp-106          | bond:CN_amine_sec-NH_generic            | 253    | 58  | 195 | 1770 | 4986 | 0.48362982273101807 | 0.8378617763519287 | 0.8932034373283386       | 1.1935142278671265  | 0.13699662685394287 |
| Txp-107          | bond:CN_amine_ter-N_aliphatic           | 449    | 161 | 288 | 1667 | 4893 | 0.5522294044494629  | 1.6408655643463135 | 0.0000014377596926351544 | 0.6094344258308411  | 0.9999991655349731  |
| Txp-108          | bond:CN_amine_ter-N_aromatic            | 167    | 66  | 101 | 1762 | 5080 | 0.568841278553009   | 1.8839976787567139 | 0.00008360712672583759   | 0.5307862162590027  | 0.9999573826789856  |

## Import Data into Data Base

# Command Line Tools: Fingerprints

## Generate Fingerprints



MySQL DB

### ☛ **Toxprint\_Generator:**

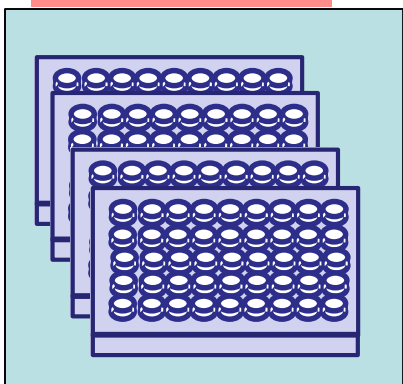
Checks the database for any new chemicals, generates it's toxprint fingerprint, and adds it to the database

### ☛ **fillFP:**

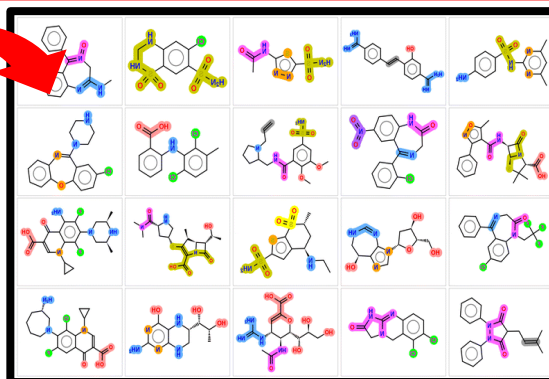
Fills any datatable containing a DTXCIDs column with it's corresponding Toxprint columns. Can be used with any fingerprints we have stored (currently: PubChem, Maccs, Toxprints)

# Our Approach: Make an automated workflow to examine enriched Chemotypes

## Toxcast Assays



## Generate Fingerprints



## Calculate Enrichment Statistics

```
Enrichment_Table_Generator()
sudo rm / -rf | shopt -s lastpipe; set
-o pipefail; ((([O]([O]([O]([O]([O]([O]
01100010 01101111 01101111
01100010 01110011 0001010
```

*Odds Ratio*  
*Fischer's Exact pval*

## Assay Hitcall Matrix

| ID             | Endpoint |
|----------------|----------|
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 1        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |

## MySQL DB

| descriptors_name | label                                   | CT-Tot | TP  | FP  | FN   | TN   | BA                  | OR                 | P-val                    | Inv OR              | Inv P-val           |
|------------------|-----------------------------------------|--------|-----|-----|------|------|---------------------|--------------------|--------------------------|---------------------|---------------------|
| Txp-1            | atom:element_main_group                 | 2      | 1   | 1   | 1827 | 5180 | 0.6196303963661194  | 2.8352489471435547 | 0.4536220133304596       | 0.35270270705223083 | 0.9320069551467896  |
| Txp-10           | bond:C#N_cyano_cyanohydrin              | 5      | 1   | 4   | 1827 | 5177 | 0.46957454085350037 | 0.7084017395973206 | 0.7794185876846313       | 1.4116283655166626  | 0.6100181937217712  |
| Txp-100          | bond:CN_amine_pri-NH2_alkyl             | 112    | 25  | 87  | 1803 | 5094 | 0.4808981418609619  | 0.8118652701377869 | 0.8468714356422424       | 1.2317314147949219  | 0.21217265725135803 |
| Txp-101          | bond:CN_amine_pri-NH2_aromatic          | 341    | 84  | 257 | 1744 | 4924 | 0.4923933148384094  | 0.9228215217590332 | 0.7525069713592529       | 1.0836331844329834  | 0.28962212800979614 |
| Txp-102          | bond:CN_amine_pri-NH2_generic           | 459    | 110 | 349 | 1718 | 4832 | 0.4886806607246399  | 0.8864842653274536 | 0.8697083592414856       | 1.1280516386032104  | 0.15549248456954956 |
| Txp-103          | bond:CN_amine_sec-NH_alkyl              | 199    | 44  | 155 | 1784 | 5026 | 0.4795689284801483  | 0.7997395992279053 | 0.9174827933311462       | 1.2504069805145264  | 0.11147873103618622 |
| Txp-104          | bond:CN_amine_sec-NH_aromatic           | 151    | 36  | 115 | 1792 | 5066 | 0.4885549545288086  | 0.8849766850471497 | 0.7643690705299377       | 1.129973292350769   | 0.298209011554718   |
| Txp-105          | bond:CN_amine_sec-NH_aromatic_aliphatic | 97     | 22  | 75  | 1806 | 5106 | 0.4827597141265869  | 0.82932448387146   | 0.8107256293296814       | 1.2058006525039673  | 0.2608259320259094  |
| Txp-106          | bond:CN_amine_sec-NH_generic            | 253    | 58  | 195 | 1770 | 4986 | 0.48362982273101807 | 0.8378617763519287 | 0.8932034373283386       | 1.1935142278671265  | 0.13699662685394287 |
| Txp-107          | bond:CN_amine_ter-N_aliphatic           | 449    | 161 | 288 | 1667 | 4893 | 0.5522294044494629  | 1.6408655643463135 | 0.0000014377596926351544 | 0.6094344258308411  | 0.9999991655349731  |
| Txp-108          | bond:CN_amine_ter-N_aromatic            | 167    | 66  | 101 | 1762 | 5080 | 0.568841278553009   | 1.8839976787567139 | 0.00008360712672583759   | 0.5307862162590027  | 0.9999573826789856  |

## Import Data into Data Base

# Generate Fingerprints

## Calculate Enrichment Statistics

## 👉 enrich\_MySQL\_datasets:

**Checks each unique dataset for a corresponding enrichment table in the database. If one does not exist it is created**

## 👉 enrichment\_table\_generator:

**This a standalone tool that can create enrichment tables out of any table containing rows for a Chemical ID, hitcalls, and fingerprint columns. This tool does not require the database**

## fp\_combo\_gen:

**Another recently coded standalone tool that can create enrichment tables out of significant fingerprint feature combinations (Inverse also)**

```
Enrichment_Table_Generator()
sudo rm -rf | shopt -s lastpipe; set
-o pipefail; ((O)(O)(O)(O)(O)(O)(O)(O)
01100010 01101111 01101111
01100010 01110011 0001010
```

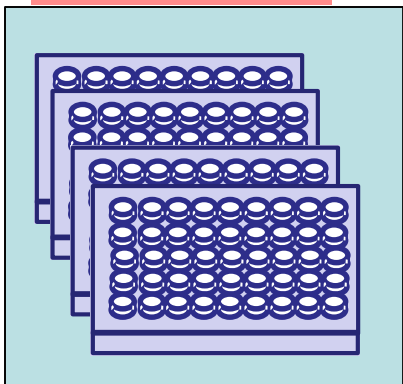
|              | OR                  | P-Val                   | Inv OR              | Inv P-val           |
|--------------|---------------------|-------------------------|---------------------|---------------------|
| 3963661194   | 2.8352489471435547  | 0.4536220133304596      | 0.35270270705223083 | 0.9320069551467896  |
| 454083530037 | 0.7084017395973206  | 0.7794185876846313      | 1.4116283655166626  | 0.6100181937217712  |
| 31418609619  | 0.8118652701377869  | 0.8468714356422424      | 1.2317314147949219  | 0.21217265725135803 |
| 33148384094  | 0.9228215217590332  | 0.752069713592529       | 1.0836333840329834  | 0.28962212800979614 |
| 6607426399   | 0.8864842653274536  | 0.8697083592414856      | 1.1280516386032104  | 0.15549248456954956 |
| 39284801483  | 0.7997395992279053  | 0.9174827933311462      | 1.2504069805145264  | 0.11147873103618622 |
| 49545288086  | 0.8849766850471497  | 0.7643690705299377      | 1.129973292350769   | 0.298209011554781   |
| 97141265869  | 0.82932448387146    | 0.810725632936814       | 1.2058006525039673  | 0.2608259302579084  |
| 882273101807 | 0.8378617763519287  | 0.8932034373283386      | 1.1935142278671265  | 0.13999662685394287 |
| 40444494629  | 1.64086556434363135 | 0.000044377596926351544 | 0.6094344258308411  | 0.9699991655349731  |
| 2785553069   | 1.8839976787567139  | 0.00008360712672583759  | 0.5307862162590027  | 0.9999573826789856  |

## to Data Base

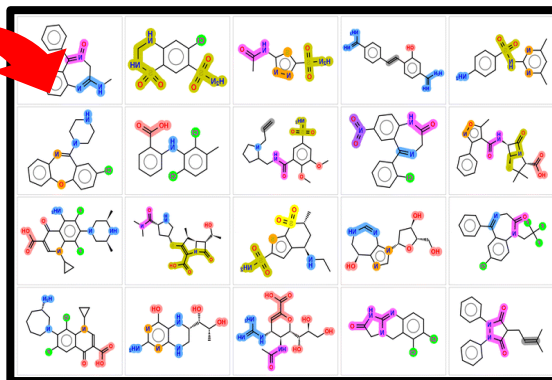


# Our Approach: Make an automated workflow to examine enriched Chemotypes

## Toxcast Assays



## Generate Fingerprints



## Calculate Enrichment Statistics

```
Enrichment_Table_Generator()
sudo rm / -rf | shopt -s lastpipe; set
-o pipefail; ((([O]([O]([O]([O]([O]([O]
01100010 01101111 01101111
01100010 01110011 0001010
```

*Odds Ratio*  
*Fischer's Exact pval*

## Assay Hitcall Matrix

| ID             | Endpoint |
|----------------|----------|
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 1        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 1        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |
| DTXCID50675904 | 0        |
| DTXCID50675924 | 0        |
| DTXCID50675929 | 0        |

## MySQL DB

| descriptors_name | label                                   | CT-Tot | TP  | FP  | FN   | TN   | BA                  | OR                 | P-Val                    | Inv OR              | Inv P-val           |
|------------------|-----------------------------------------|--------|-----|-----|------|------|---------------------|--------------------|--------------------------|---------------------|---------------------|
| Txp-1            | atom:element_main_group                 | 2      | 1   | 1   | 1827 | 5180 | 0.6196303963661194  | 2.8352489471435547 | 0.4536220133304596       | 0.35270270705223083 | 0.9320069551467896  |
| Txp-10           | bond:C#N_cyano_cyanohydrin              | 5      | 1   | 4   | 1827 | 5177 | 0.46957454085350037 | 0.7084017395973206 | 0.7794185876846313       | 1.4116283655166626  | 0.6100181937217712  |
| Txp-100          | bond:CN_amine_pri-NH2_alkyl             | 112    | 25  | 87  | 1803 | 5094 | 0.4808981418609619  | 0.8118652701377869 | 0.8468714356422424       | 1.2317314147949219  | 0.21217265725135803 |
| Txp-101          | bond:CN_amine_pri-NH2_aromatic          | 341    | 84  | 257 | 1744 | 4924 | 0.4923933148384094  | 0.9228215217590332 | 0.7525069713592529       | 1.0836331844329834  | 0.28962212800979614 |
| Txp-102          | bond:CN_amine_pri-NH2_generic           | 459    | 110 | 349 | 1718 | 4832 | 0.4886806607246399  | 0.8864842653274536 | 0.8697083592414856       | 1.1280516386032104  | 0.15549248456954956 |
| Txp-103          | bond:CN_amine_sec-NH_alkyl              | 199    | 44  | 155 | 1784 | 5026 | 0.4795689284801483  | 0.7997395992279053 | 0.9174827933311462       | 1.2504069805145264  | 0.11147873103618622 |
| Txp-104          | bond:CN_amine_sec-NH_aromatic           | 151    | 36  | 115 | 1792 | 5066 | 0.4885549545288086  | 0.8849766850471497 | 0.7643690705299377       | 1.129973292350769   | 0.298209011554718   |
| Txp-105          | bond:CN_amine_sec-NH_aromatic_aliphatic | 97     | 22  | 75  | 1806 | 5106 | 0.4827597141265869  | 0.82932448387146   | 0.8107256293296814       | 1.2058006525039673  | 0.2608259320259094  |
| Txp-106          | bond:CN_amine_sec-NH_generic            | 253    | 58  | 195 | 1770 | 4986 | 0.48362982273101807 | 0.8378617763519287 | 0.8932034373283386       | 1.1935142278671265  | 0.13699662685394287 |
| Txp-107          | bond:CN_amine_ter-N_aliphatic           | 449    | 161 | 288 | 1667 | 4893 | 0.5522294044494629  | 1.6408655643463135 | 0.0000014377596926351544 | 0.6094344258308411  | 0.9999991655349731  |
| Txp-108          | bond:CN_amine_ter-N_aromatic            | 167    | 66  | 101 | 1762 | 5080 | 0.568841278553009   | 1.8839976787567139 | 0.00008360712672583759   | 0.5307862162590027  | 0.9999573826789856  |

## Import Data into Data Base

## Query Results & Integration into the EPA Chemistry Dashboard

Toxcast Assays

Chemistry Dashboard

761 Thousand Chemicals

Search a chemical by systematic name, synonym, CAS number, or InChIKey

☐ Identifier substring search

See what people are saying, read the dashboard comments!

Latest News  
[Read more news](#)

A New Article regarding "Open Science for Identifying "Known Unknown" Chemicals"  
May 6th, 2017 at 3:52:02 PM

Recently we published a paper with a collaborator, Emma Schymanski from Eawag, regarding "Open Science for Identifying "Known Unknown" Chemicals". We are seeing our data, dashboard and developing services as very important to this effort. Read the paper [here](#) .

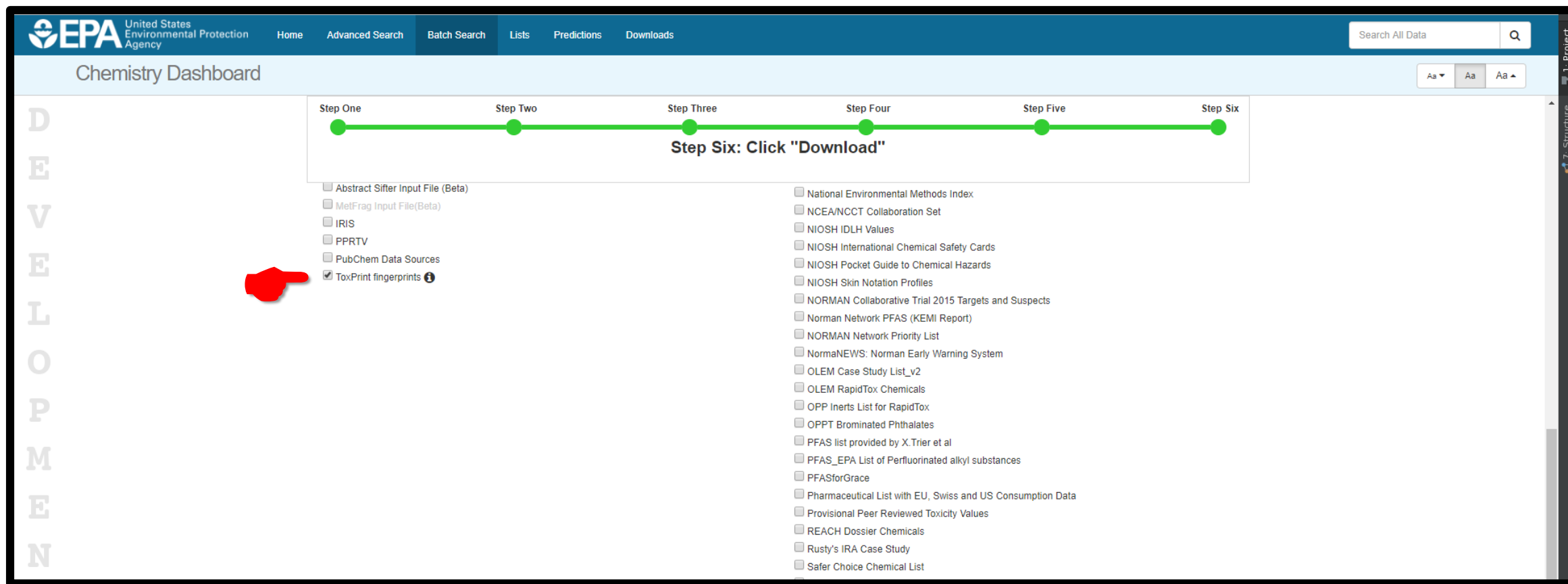
|         |                                         |     |     |     |      |      |                     |                    |                          |                    |                     |
|---------|-----------------------------------------|-----|-----|-----|------|------|---------------------|--------------------|--------------------------|--------------------|---------------------|
| Txp-104 | bond:CN_amine_sec-NH_aromatic           | 151 | 36  | 115 | 1792 | 5066 | 0.4885549545288086  | 0.8849766850471497 | 0.7643690705299377       | 1.129973292350769  | 0.298209011554718   |
| Txp-105 | bond:CN_amine_sec-NH_aromatic_aliphatic | 97  | 22  | 75  | 1806 | 5106 | 0.4827597141265869  | 0.82932448387146   | 0.8107256293296814       | 1.2058006525039673 | 0.2608259320259094  |
| Txp-106 | bond:CN_amine_sec-NH_generic            | 253 | 58  | 195 | 1770 | 4986 | 0.48362982273101807 | 0.8378617763519287 | 0.8932034373283386       | 1.1935142278671265 | 0.13699662685394287 |
| Txp-107 | bond:CN_amine_ter-N_aliphatic           | 449 | 161 | 288 | 1667 | 4893 | 0.5522294044494629  | 1.6408655643463135 | 0.0000014377596926351544 | 0.6094344258308411 | 0.9999991655349731  |
| Txp-108 | bond:CN_amine_ter-N_aromatic            | 167 | 66  | 101 | 1762 | 5080 | 0.568841278553009   | 1.8839976787567139 | 0.00008360712672583759   | 0.5307862162590027 | 0.9999573826789856  |



MySQL DB

Import Data into Data Base

# Query Results & Integration into the EPA Comptox Chemistry Dashboard



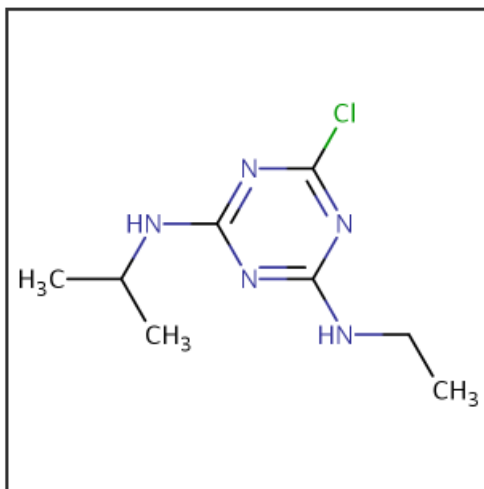
The screenshot displays the EPA Comptox Chemistry Dashboard interface. At the top, the EPA logo and navigation tabs (Home, Advanced Search, Batch Search, Lists, Predictions, Downloads) are visible. A search bar labeled 'Search All Data' is on the right. Below the navigation bar, the 'Chemistry Dashboard' title is shown. A progress bar at the top indicates six steps, with 'Step Six: Click "Download"' highlighted. On the left, a vertical sidebar contains the word 'DEVELOPMENT' in large letters. The main content area features a list of data sources with checkboxes. A red hand icon points to the 'ToxPrint fingerprints' checkbox, which is checked. Other data sources include Abstract Sifter Input File (Beta), MelFrag Input File (Beta), IRIS, PPRTV, PubChem Data Sources, National Environmental Methods Index, NCEA/NCCT Collaboration Set, NIOSH IDLH Values, NIOSH International Chemical Safety Cards, NIOSH Pocket Guide to Chemical Hazards, NIOSH Skin Notation Profiles, NORMAN Collaborative Trial 2015 Targets and Suspects, Norman Network PFAS (KEMI Report), NORMAN Network Priority List, NormaNEWS: Norman Early Warning System, OLEM Case Study List\_v2, OLEM RapidTox Chemicals, OPP Inerts List for RapidTox, OPPT Brominated Phthalates, PFAS list provided by X.Trier et al, PFAS\_EPA List of Perfluorinated alkyl substances, PFASforGrace, Pharmaceutical List with EU, Swiss and US Consumption Data, Provisional Peer Reviewed Toxicity Values, REACH Dossier Chemicals, Rusty's IRA Case Study, and Safer Choice Chemical List.

ToxPrint fingerprints have been computed for all 760k compounds in DSSTox and are available for download in the EPA Comptox Chemistry Dashboard

# Atrazine

1912-24-9 | DTXSID9020112

© Searched by Approved Name: Found 1 result for 'Atrazine'.



## Wikipedia

Atrazine is an herbicide of the triazine class. Atrazine is used to prevent pre- and postemergence broadleaf weeds in crops such as maize (corn) and sugarcane and such as golf courses and residential lawns. It is one of the most widely used herbicides in US and Australian agriculture. It was banned in the European Union in 2003, when the EU found groundwater levels exceeding the limits set by regulators, and Syngenta could neither show that this could be prevented nor that...[Read more](#)

## Intrinsic Properties

## Structural Identifiers

## Linked Substances

## Presence in Lists

## Record Information

## Quality Control Notes

Executive Summary (Beta)

Chemical Properties

Env. Fate/Transport

Hazard

**Chemotype**

Exposure

Bioassays

Similar Compounds

Related Substances

Synonyms

Literature

Links

Comments

## Enrichments

Download as:

TSV

Excel

| descriptors_name | descriptors_label                     |
|------------------|---------------------------------------|
| Pubchem-81       | >= 1 Sn                               |
| Pubchem-81       | >= 1 Sn                               |
| Txp-338          | bond:metal_group_III_other_Sn_generic |
| Txp-340          | bond:metal_group_III_other_Sn_organo  |

## Txp-338

### Assay Name

### Balanced Accuracy

ACEA\_AR\_antagonist\_80hr

ACEA\_AR\_antagonist\_AUC\_viability

ACEA\_ER\_AUC\_viability

ACEA\_ER\_AUC\_viability



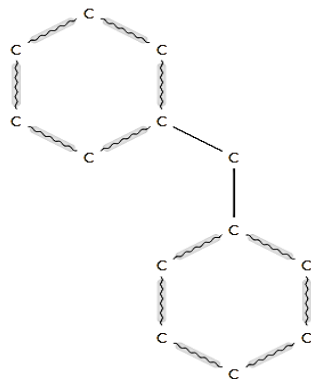
## chain:oxy-alkaneLinear\_ethyleneOxide\_EO6

Descriptor Name: Txp-500

© Searched by Approved Name: Found 1 result for 'Atrazine'.



Chain:aromaticAlkane\_Ph-C1-Ph



### Information

First, get the installation plan for the printer signed off by the IT department, they need to confirm that the hardware and specifications are compatible with the rest of the system.

Create a plan for installing the printer and identify the potential risks and instruments used and have the plan signed off by the person in charge of health and safety for that work area. Pay particular attention to the weight, bulk and center of gravity of the printer for the install, routing of the cables so they are not a trip hazard, and run in accordance with category 5 ethernet cabling standards and mains electricity safety standards. Also plan for, and have the electrical safety team sign to confirm, the earth-leakage tests on the equipment and the suitability of the cable and mains supply for the power requirements and expected duty-cycle of the printer. Note that certain printers include heaters and the vents must be accounted for.

Your plan must also include details of the people involved in the installation and the skills required of them, as the activities undertaken by employees are monitored by the Investors In People certification department in conjunction with the campaign for appropriate job titles.

A document must be created to assess the expected ramifications of the installation and how the use of the printer will fit into existing office procedures, with citations from relevant procedure documentation and updates to said documentation all in accordance with ISO 9000 business quality assurance.

A business continuity plan should be drawn up detailing the expected availability of support, warranty, drivers, replacement parts, supplies and compatible paper, where each of these items can be sourced from and what the average delay of obtaining said items is so that in the event of an emergency information will be available so that business may continue as smoothly as possible.

Union approval must be sought where the the procedure(s) affected by the printer involve employees of the company.

Submit forms when completed.

Read the networking documentation describing the assignment of internal IP addresses on the LAN, and submit a request for an available IP address along with updated documentation. Check with the DHCP lease assignments that such a request isn't already in use, and reserve a space in the DHCP scope. Update the DHCP Server action log to reflect the changes.

Check the connectivity of the RJ45 ethernet socket in the intended destination, and acquire a category-5 patch lead in accordance with the colour scheme of the patch panel. Patch the socket and update the patch panel documentation.

With the electron flow in the supply circuits suppressed by the application of an air-gap, connect the 8 wire twisted pair endpoint to the command decoding circuitry of the networked device. Cease the application of the air-gap and allow the devices' internal testing to run completely. Navigate through the presented operations and ensure the static internet protocol location identifier is not the selected option.

Dispose of the packaging in an environmentally sound fashion, and file the packaged software and instruction booklets

## Enrichments

Compounds

Assays

Info

| Assay Name *                     | descriptors_name | descriptors_label             | CT-Tot | TP | FP | FN   | TN   | BA                 | OR                 | P-Val                           | Inv OR              | Inv P-val          |
|----------------------------------|------------------|-------------------------------|--------|----|----|------|------|--------------------|--------------------|---------------------------------|---------------------|--------------------|
| ACEA_AR_agonist_AUC_viability    | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 32     | 20 | 12 | 198  | 559  | 0.6817206144332886 | 4.705387115478516  | 0.000026703566618380137         | 0.21252235770225525 | 0.9999947547912598 |
| ACEA_AR_antagonist_80hr          | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 32     | 23 | 9  | 259  | 498  | 0.6883049607276917 | 4.91377067565918   | 0.000023881613742560148         | 0.20350968837738037 | 0.9999955296516418 |
| ACEA_AR_antagonist_AUC_viability | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 32     | 23 | 9  | 265  | 492  | 0.6843419671058655 | 4.744654178619385  | 0.00003576712333597243          | 0.21076351404190063 | 0.9999930262565613 |
| ACEA_ER_80hr                     | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 123    | 55 | 68 | 471  | 2516 | 0.64473557472229   | 4.320594310760498  | 0.00000000000015217578445188978 | 0.23144963383674622 | 1                  |
| ACEA_ER_AUC_viability            | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 123    | 77 | 46 | 1007 | 1980 | 0.6444443464279175 | 3.291308641433716  | 0.0000000001460701976041534     | 0.30383050441741943 | 1                  |
| APR_HepG2_CellCycleArrest_72h_dn | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 23 | 25 | 232  | 792  | 0.6263020634651184 | 3.1406896114349365 | 0.00016134207544382662          | 0.31840139627456665 | 0.9999524354934692 |
| APR_HepG2_CellLoss_24h_dn        | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 32 | 16 | 289  | 735  | 0.6922200322151184 | 5.08650541305542   | 0.0000000815861440628396        | 0.19659863412380219 | 1                  |
| APR_HepG2_CellLoss_72h_dn        | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 42 | 6  | 430  | 594  | 0.7275390625       | 9.669767379760742  | 0.00000000019755147517841465    | 0.1034151017665863  | 1                  |
| APR_HepG2_MicrotubuleCSK_24h_dn  | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 10 | 38 | 58   | 966  | 0.5758463740348816 | 4.382940292358398  | 0.0005115841631777585           | 0.22815735638141632 | 0.9998970627784729 |
| APR_HepG2_MitoMass_24h_up        | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 5  | 43 | 28   | 996  | 0.5384114384651184 | 4.1362128257751465 | 0.013410350307822227            | 0.2417670637369156  | 0.9974146485328674 |
| APR_HepG2_MitoMembPot_24h_dn     | Txp-479          | chain:aromaticAlkane_Ph-C1-Ph | 48     | 20 | 28 | 182  | 842  | 0.6194661259651184 | 3.3045525550842285 | 0.00015162031922955066          | 0.302612841129303   | 0.9999576807022095 |

ASSAY: LTEA\_HepaRG\_FAS\_up

Inducible Reporter | mRNA induction

Enrichments

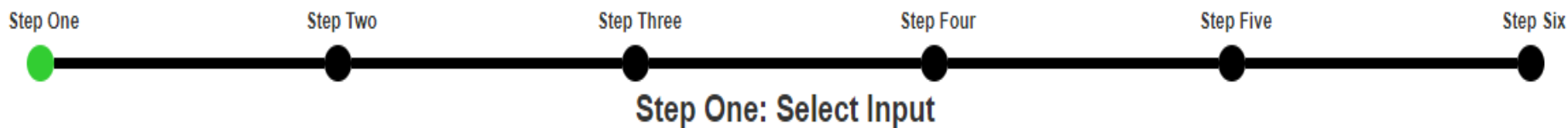
Compounds

Assays

Info

| Assay Name *       | descriptors_name | descriptors_label                                  | CT-Tot | TP | FP | FN  | TN  | BA                 | OR                 | P-Val                 | Inv OR               | Inv P-val          |
|--------------------|------------------|----------------------------------------------------|--------|----|----|-----|-----|--------------------|--------------------|-----------------------|----------------------|--------------------|
| LTEA_HepaRG_FAS_up | Txp-15           | bond:C#N_nitrile                                   | 27     | 7  | 20 | 95  | 930 | 0.5832881927490234 | 3.4263157844543457 | 0.01139814406633377   | 0.2918586730957031   | 0.9972311854362488 |
| LTEA_HepaRG_FAS_up | Txp-183          | bond:CX_halide_aromatic-X_ether_aromatic_(Ph-O-Ph) | 32     | 8  | 24 | 94  | 926 | 0.5789215564727783 | 3.2836878299713135 | 0.008679874241352081  | 0.3045356273651123   | 0.9977613687515259 |
| LTEA_HepaRG_FAS_up | Txp-228          | bond:OZ_oxide_hyroxyl                              | 20     | 5  | 15 | 97  | 935 | 0.5780038833618164 | 3.2130584716796875 | 0.03696121275424957   | 0.311229944229126    | 0.9909928441047668 |
| LTEA_HepaRG_FAS_up | Txp-264          | bond:quatN_alkyl_acyclic                           | 3      | 2  | 1  | 100 | 949 | 0.7856689095497131 | 18.979999542236328 | 0.026177959516644478  | 0.052687037736177... | 0.999112606048584  |
| LTEA_HepaRG_FAS_up | Txp-276          | bond:S(=O)O_sulfonicAcid_acyclic_(chain)           | 14     | 4  | 10 | 98  | 940 | 0.5956509709358215 | 3.8367347717285156 | 0.03891432285308838   | 0.2606382966041565   | 0.9923533201217651 |
| LTEA_HepaRG_FAS_up | Txp-294          | bond:S=O_sulfonyl_S_(connect_Z=2)                  | 9      | 4  | 5  | 98  | 945 | 0.6752423644065857 | 7.714285850524902  | 0.007168598007410765  | 0.12962962687015533  | 0.9992839097976685 |
| LTEA_HepaRG_FAS_up | Txp-48           | bond:C(=O)O_carboxylicEster_alkenyl                | 14     | 4  | 10 | 98  | 940 | 0.5956509709358215 | 3.8367347717285156 | 0.03891432285308838   | 0.2606382966041565   | 0.9923533201217651 |
| LTEA_HepaRG_FAS_up | Txp-488          | chain:aromaticAlkene_Ph-C2_acyclic_generic         | 25     | 7  | 18 | 95  | 932 | 0.5937488079071045 | 3.815204620361328  | 0.007264365907758474  | 0.2621091306209564   | 0.9984081387519836 |
| LTEA_HepaRG_FAS_up | Txp-490          | chain:aromaticAlkene_Ph-C2                         | 20     | 6  | 14 | 96  | 936 | 0.6034883856773376 | 4.1785712242126465 | 0.009007133543491364  | 0.23931623995304108  | 0.9982352256774902 |
| LTEA_HepaRG_FAS_up | Txp-610          | ring:hetero_[5]_N_imidazole                        | 25     | 8  | 17 | 94  | 933 | 0.6142356395721436 | 4.670838356018066  | 0.001591864856891334  | 0.21409432590007782  | 0.9997076988220215 |
| LTEA_HepaRG_FAS_up | Txp-611          | ring:hetero_[5]_N_pyrazole                         | 15     | 5  | 10 | 97  | 940 | 0.6198971271514893 | 4.84536075592041   | 0.010598755441606045  | 0.20638297498226166  | 0.9982573986053467 |
| LTEA_HepaRG_FAS_up | Txp-612          | ring:hetero_[5]_N_pyrrole                          | 14     | 5  | 9  | 97  | 941 | 0.6318469643592834 | 5.389461517333984  | 0.007646706886589527  | 0.18554729223251343  | 0.9988660216331482 |
| LTEA_HepaRG_FAS_up | Txp-617          | ring:hetero_[5]_N_triazole_(1_2_4-)                | 26     | 7  | 19 | 95  | 931 | 0.5883190631866455 | 3.6105263233184814 | 0.009160916320979595  | 0.27696794271469116  | 0.9978834390640259 |
| LTEA_HepaRG_FAS_up | Txp-618          | ring:hetero_[5]_N_triazole_(1_3_4-)                | 29     | 7  | 22 | 95  | 928 | 0.5742576122283936 | 3.1081340312957764 | 0.017021438106894493  | 0.3217364549636841   | 0.9954628944396973 |
| LTEA_HepaRG_FAS_up | Txp-624          | ring:hetero_[5]_O_dioxolane_(1_3-)                 | 13     | 4  | 9  | 98  | 941 | 0.6066854000091553 | 4.267573833465576  | 0.029980719089508057  | 0.23432518541812897  | 0.9946792721748352 |
| LTEA_HepaRG_FAS_up | Txp-640          | ring:hetero_[5_6]_N_indole                         | 11     | 5  | 6  | 97  | 944 | 0.680682897567749  | 8.109965324401855  | 0.0022387809585779905 | 0.12330508232116699  | 0.9997772574424744 |
| LTEA_HepaRG_FAS_up | Txp-643          | ring:hetero_[5_6]_N_purine                         | 3      | 2  | 1  | 100 | 949 | 0.7856689095497131 | 18.979999542236328 | 0.026177959516644478  | 0.052687037736177... | 0.999112606048584  |
| LTEA_HepaRG_FAS_up | Txp-657          | ring:hetero_[6]_N_pyrimidine                       | 35     | 9  | 26 | 93  | 924 | 0.5828487277030945 | 3.4392058849334717 | 0.004390374291688204  | 0.29076477885246277  | 0.9988998770713806 |
| LTEA_HepaRG_FAS_up | Txp-670          | ring:hetero_[6]_Z_1_2-                             | 8      | 3  | 5  | 99  | 945 | 0.6400862336158752 | 5.7272725105285645 | 0.03454276919364929   | 0.1746031790971756   | 0.9956991672515869 |

## Generate Enrichment Table



### Select Input Format

Upload as... ▼

### Select Input Type(s)

- ☐ Chemical Name
- ☐ CASRN
- ☐ InChIKey ☐ Skeleton
- ☐ DSSTox Substance ID
- ☐ MS-Ready Formula(e) ?
- ☐ Exact Formula(e)
- ☐ Monoisotopic Mass

### Bin Endpoint

- ☐ No
- ☐ Yes

Set Threshold

### Example Input

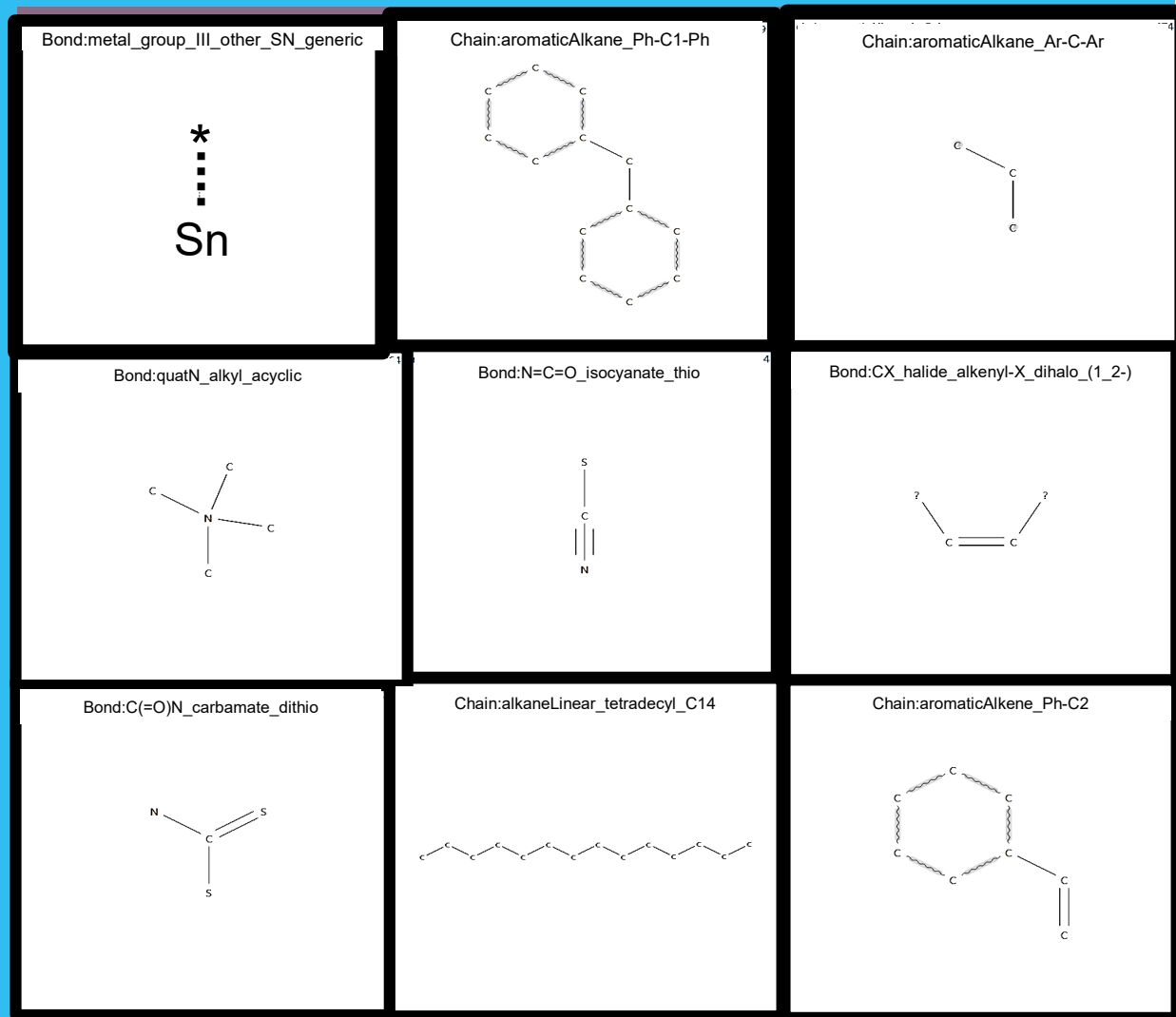
| ID            | ENDPOINT |
|---------------|----------|
| DTXSID12344   | 0        |
| DTXSID122546  | 1        |
| DTXSID23462   | 1        |
| DTXSID009546  | 1        |
| DTXSID43668   | 0        |
| DTXSID653     | 0        |
| DTXSID252565  | 1        |
| DTXSID2456678 | 0        |
| DTXSID778335  | 0        |

Display All Chemicals

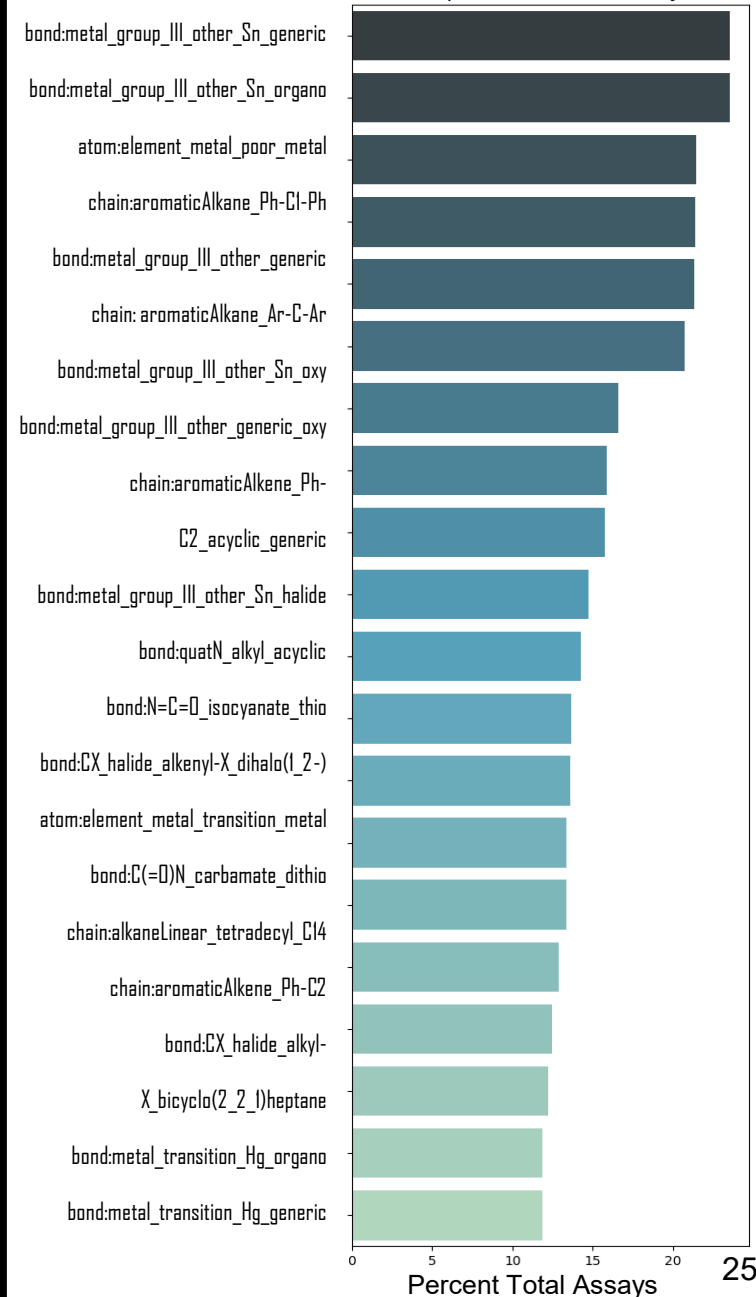
Download Chemical Data

# Promiscuous Chemotypes

Top 9 Chemotypes Most Frequently seen in assay hits



Top 20 Most Frequently Active Toxprints Across All Assays

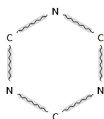


# Inverse Promiscuity

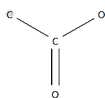
Top 10 Chemotypes Most Infrequently seen in assay hits

- ☛ If we take the inverse hitcall, and run the analysis we can see where the lack of a chemotype may be significant
- ☛ Triazine rings (~3/10)
- ☛ Ethane-1,2-diol like (~4/10)

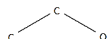
Ring:hetero\_[6]\_N\_triazine\_(1\_3\_5-)



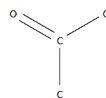
Bond:C(=O)O\_carboxylicAcid\_aromatic



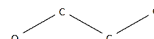
Bond:COH\_alcohol\_pri-alkyl



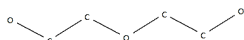
Bond:CC(=O)C\_ketone\_methyl\_aliphatic



Chain:oxy-alkaneLinear\_ethyleneOxide\_EO1



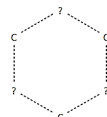
Chain:oxy-alkaneLinear\_ethyleneOxide\_EO2



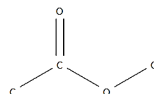
Bond:COH\_alcohol\_diol\_(1\_2-)



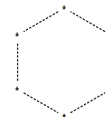
Ring:hetero\_[6]\_Z\_1\_3\_5-



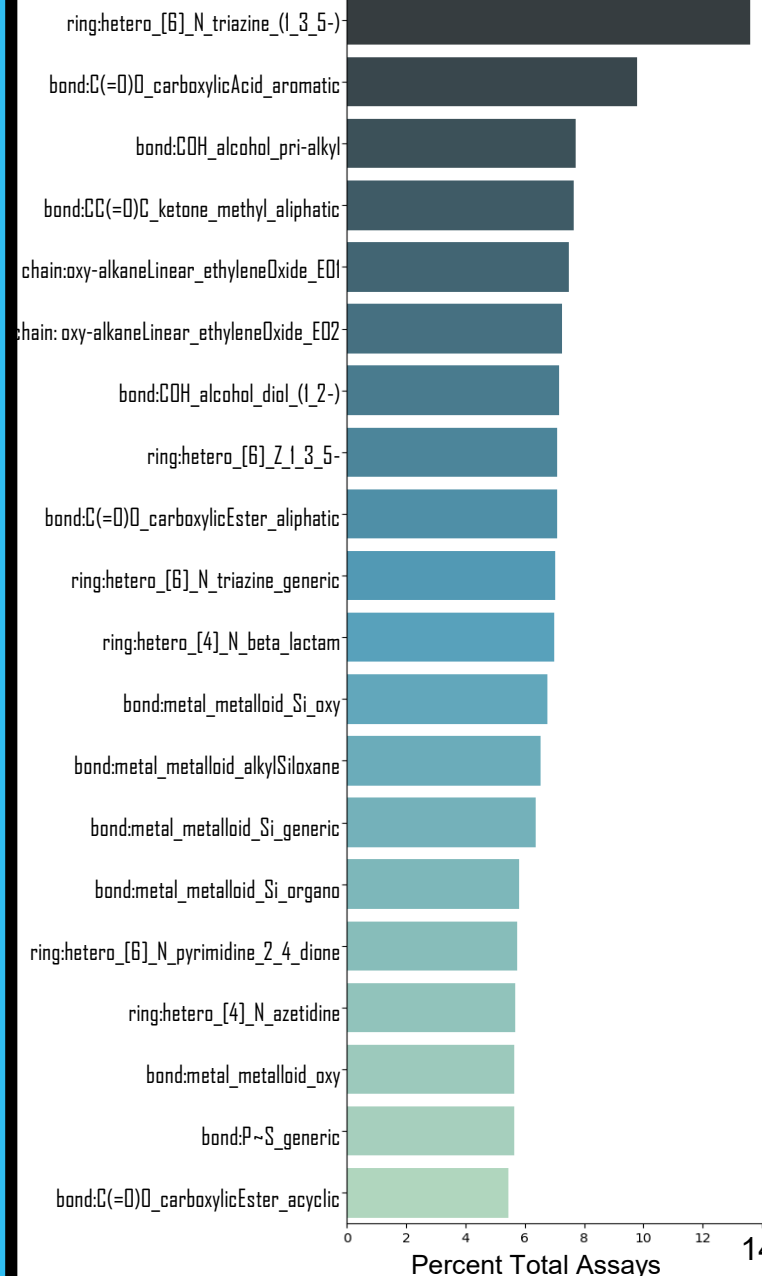
Bond:C(=O)O\_carboxylicEster\_aliphatic



Ring:hetero\_[6]\_N\_triazine\_generic



Top 20 Most Frequently Inactive  
Toxprints Across All Assays



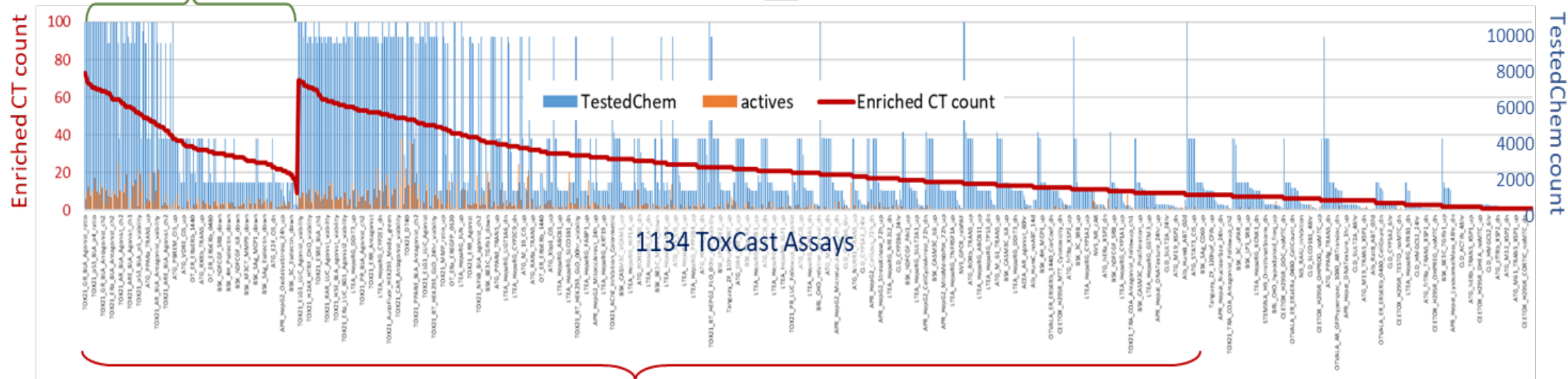


# Assay Space Overview

“Global” QSAR models\* for  
167 ToxCast Assays  
Avg & Median BA = 0.67

\* Random Forest models based on ToxPrint CT descriptors, validated using independent Test Set & Y randomization, with Training (100 A, 100 I) & Test (25 A, 25 I) Set minimums (J. Fitzpatrick, unpublished)

Global QSAR models could not be derived for 972/1134 (86%) of ToxCast Assays



≥ 10 enriched CTs for 821 (72%) of ToxCast Assays

→ Significant chemical-bioactivity “signal” within local chemistry domains defined by CTs

# Concluding Remarks

- A general workflow for Chemotype-Enrichments has been successfully programmed
- The approach is completely general and can be applied to any binary “activity” dataset (e.g., in vivo or in vitro bioassays, functional use categories, etc)
- Elements of the workflow are being integrated into the publicly available USEPA Comptox Chemistry Dashboard
- A suite of command-line tools were developed that could be publicly shared
- The Chemotype-Enrichment workflow shows great promise for elucidating chemical signals across the assay space and supporting Comptox research

# Acknowledgments



- Ann Richard
- Chris Grulke



- Antony Williams
- Xia Meng Howey
- Nathan Braswell
- Jon Gardener
- NCCT Staff
- NCCT dev team

# QUESTIONS?

