



Cleaning PubChem Bioassa ScrubChem Bubbles

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Postdoc Research Participant

Guaranteed! Oak Ridge Institute for Science and Education (ORISE) & U.S. Environmental Protection Agency (EPA), Research Triangle Park, NC National Center for Computational Toxicology (NCCT)

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Database Cleane



ChEMBL DrugBank Tox21 PDBbind MLSP etc. BindingDB

1.2 million assay records

2.3 million chemical structures

10 thousand protein targets

Approximately <u>894 million</u> bioactivity <u>values</u>mes

! Big data is sues open parling, values across 8d if feneral decards! Build Model **Training Set Datasets** Run Test Test Set **Accuracy Discovery**

Disease & Health

Metabolism

Data

\$\$\$ >\$1B

Toxicity

QSAR

Assay Development

Docking

Reproducibility

Drug Discovery

Analysis

Discovery

Deep Learning

Machine Learning

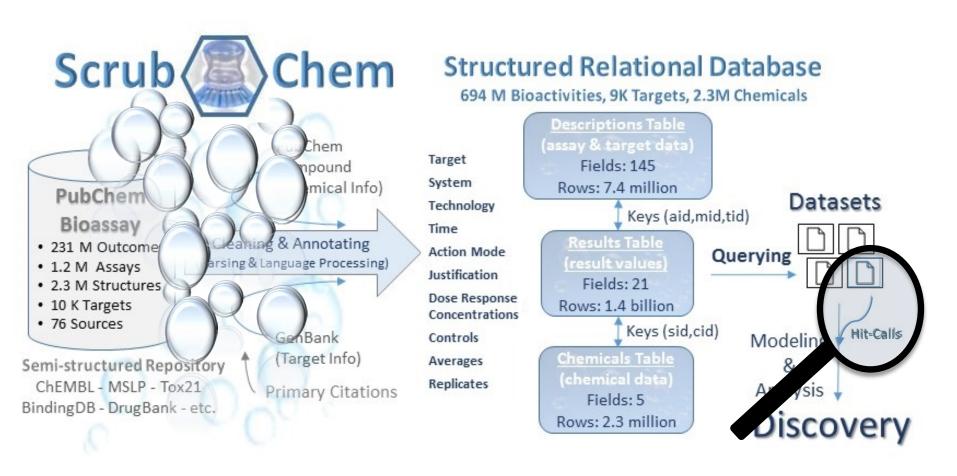
ADMET Hazard & Risk

Overview (in words)

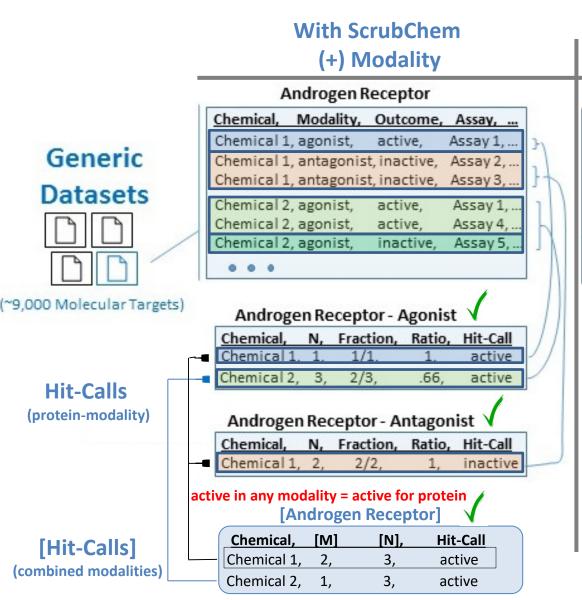
- ScrubChem is an effort to programmatically identify and correct for many big data issues related to the interoperability and standardization of biochemical data across millions of bioassay records in PubChem.
- ScrubChem concepts (e.g., modalities & justifications) establish the way forward for organizing disparate data so that it can be reliably combined into hit-calls and datasets.
- A direct result of the ScrubChem effort is a database which can be used to build many different kinds of datasets for various datadriven use cases (e.g., docking, QSAR, machine-learning, regulatory decision-making, assay design).
- ScrubChem datasets expand the number of targets and chemicals with robust and reliable data.

ScrubChem Framework

Cleaning of this data increases the number of results usable for building datasets.



"Hit-Calls"



Without ScrubChem (-) Modality

Androgen Receptor

Chemical,	Modality,	Outcome,	Assay,
Chemical 1	agonist//	active.	Assav 1
Chemical 1	antagonis	inactive,	Assay 2,
Chemical 1	antagonis	inactive,	Assay 3,
Chemical 2	agonist)	active,	Assay 1,
Chemical 2	agonist	active,	Assay 4,
Chemical 2	aponist	inactive.	Assay 5

ISSUE:

Without modality information chemical 1 appears as active 1x and inactive 2x.

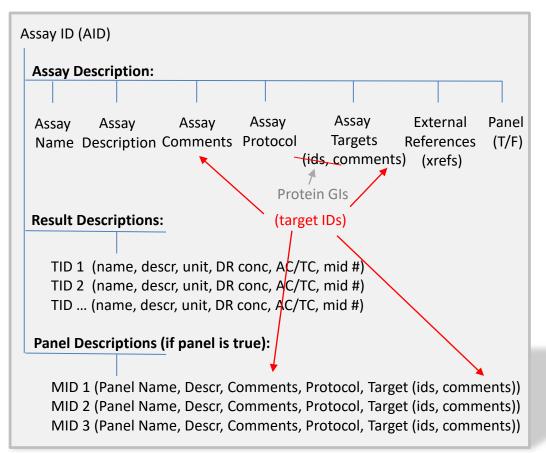
Androgen Receptor - Agonist

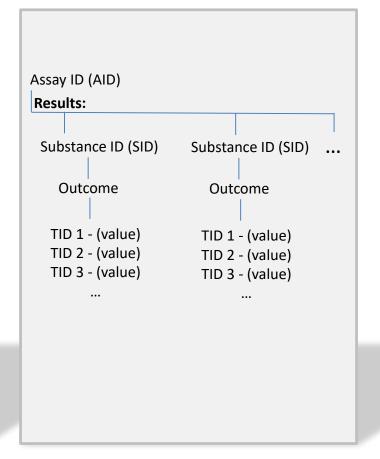


Chemical,	N,	Fraction,	Ratio,	Hit-Call
Chemical 1,	3,	2/3,	.66,	inactive
Chemical 2,	3,	2/3,	.66,	active

Case Issue 1

Issue	Impact	Solution	Affe	cted				
^a 1. Target Identifier	Loss of	- Pattern parse	- Assays	85,804	7.02%			
(Protein GI) not in a	detected	description comment	- Bioactivities	1,145,061	0.17%			
designated target	targets	sections.	- Chemicals	248,222	10.87%			
field (found instead		- Re-annotate target	- Molecular Targets 3,499 38.90					
in comment		fields.						
sections).			e.g., AID 2900, MID 0, TID 4	, SID 103263999,	CID 32817,			
			GI 550544304, TARGET 15-L	.OX				





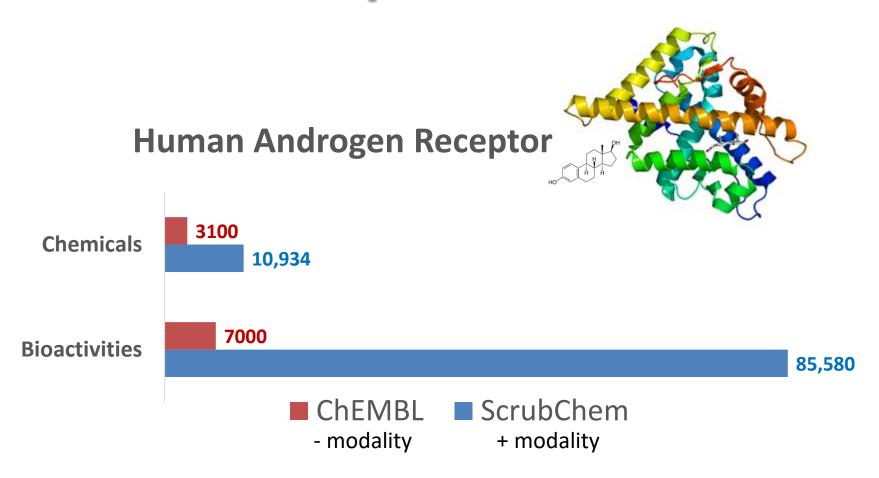
Case Issue 8 (2-7 in paper)

Issue	Impact	Solution	Affected
c! 8. Modality of Action not defined.	Loss of comparable data between assays (ambiguous data)	-Sample diversity of modality typesStandardize vocabulary for each modalityParse data fields (hierarchically) to identify most reliable modality descriptions.	- Assays: 2,094,323 91.74% - Bioactivities: #large - Molecular Targets: 8,103 90.07% - e.g., AID 3181 "Inhibitor" e.g., AID 353 "Inhibitor by INHIBITION OF PDGF-dependent autophosphorylation" e.g., AID 3586 "Inhibitor by DISPLACEMENT OF [3H]-5-HT" e.g., AID 3187 "Inhibition Constant (Ki)" e.g., AID 3183 "Inhibition Constant (Ki) by DISPLACEMENT OF binding" e.g., AID 3191 "Inhibition Constant (Ki) by DISPLACEMENT OF [125I]DOI" e.g., AID 3174 "Affinity" e.g., AID 3174 "Affinity (Km)" e.g., 243422 "Affinity Ratio" e.g., AID 3169 "Antagonist" e.g., AID 3189 "Activity" e.g., AID 3385 "Activity (EC) by stimulate glucose uptake" e.g., AID 3192 "Effective Dose (ED)"

Case Issues 9-14

Issue	Impact	Solution	Affected
^a 9. Missing digital	Loss of	- Use ChEMBL IDs to link	- Assays: 46,556 3.81%
identifiers for	source	back to ChEMBL	
literature data	citation	database and extract	e.g., AID 1207595 doi: 10.6019/CHEM
(ChEMBL)	information	primary citation data.	e.g., AID2901 doi:10.1016/S096
Spelling - anecdotes			
^a 10. Cytotoxicity as	Loss of	- Awareness of issue	e.g., AID 588719
"Cytoxicity" in AID	retrievable	Fix during pattern	
description's name.	data	parse.	
^a 11. Antagonism as	Loss of	- Awareness of issue	e.g., AID 48346
"antagonsim" in AID	retrievable	- Fix during pattern	e.g., AID 272704
description's name.	data	parse.	07
^a 12. Antagonist as	Loss of	- Awareness of issue	e.g., AID 446013
"antagonsit" in AID	retrievable	- Fix during pattern	
description's name.	data	parse.	
Missing Key Annota	tions – anecdo	tes	
^a 13. Missing result	Loss of	-Build library of unit	e.g., AID 588523, MID 0, TID 1, SID 99494248
units	retrievable	types and phrases.	
	data	- Pattern parse	
		description sections for	
		unit data.	
^a 14. AIDs with no	Slower	- Requires null checks for	e.g., AID 1208, SID 48413336
outcome field	parsing	every data field (even	e.g., AID 555, SID 843951
(required field)		required fields) Build	
		library of unit types and	
		phrases.	

Example Datasets

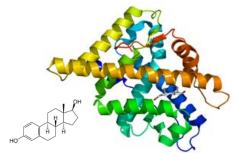


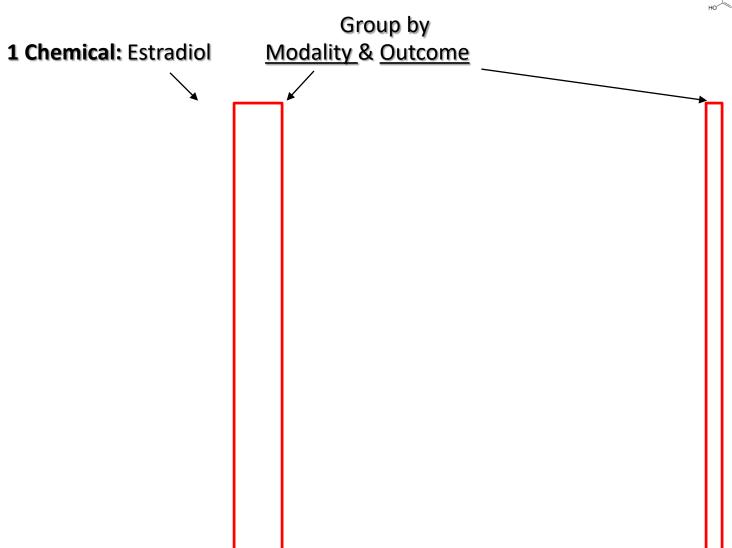
Selecting data for the **human androgen receptor** (GENE ID: 367) returns: **85,580 results** and **10,934 Chemicals** with modalities.

As a comparison, **ChEMBL** data only contains: **7,030 results** and **3,142 Chemicals** and **no modalities** for deriving hit calls.

Bioactivities for hAR

Showing 1 Chemical (estradiol) out of 11,000





Chemical Hit-Calls for hAR

Tree structure for flat file filtering

SUB CID 1140 of 1093-5757 estradiol SUB MODALITIY: 4 of 4

Showing 1 Chemical (estradiol) out of 11,000

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cne	micai			Modalit	V	(hit-c	all											
					7				1					Outcome				NF	0
CID_TYPE	cid_count	cid	NAME	MOD_TYPE	count	modality	hitcall r	atio f	raction	n s	sources #reference	es r	eferences	OUTCOME_TYPE	count	outcome			
ROOT CID:	1140 of 1093	5757	estradiol																
SUB CID	1140 of 1093	5757	estradiol	ROOT MODALITIY	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282						
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	ROOT OUTCOME:	1 of 2	1	6		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	1 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	2 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	3 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	4 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	5 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	1 of 2	1	6	INFO	6 of 6
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	ROOT OUTCOME:	2 of 2	2	1		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	1 of 4	Agonist	Active	1	1	6	824	1 2	21543282	SUB OUTCOME:	2 of 2	2	1	INFO	1 of 1
SUB CID	1140 of 1093	5757	estradiol	ROOT MODALITIY:	2 of 4	Antagonist	Active	0.8	3/4	4	824	1 2	21543282						
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	0.8	3/4	4	824	1 2	21543282	ROOT OUTCOME:	1 of 3	0	1		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	1 of 3	0	1	INFO	1 of 1
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	ROOT OUTCOME:	2 of 3	1	3		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	2 of 3	1	3	INFO	1 of 3
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	2 of 3	1	3	INFO	2 of 3
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	2 of 3	1	3	INFO	3 of 3
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	ROOT OUTCOME:	3 of 3	2	3		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	3 of 3	2	3	INFO	1 of 3
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	3 of 3	2	3	INFO	2 of 3
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	2 of 4	Antagonist	Active	8.0	3/4	4	824	1 2	21543282	SUB OUTCOME:	3 of 3	2	3	INFO	3 of 3
SUB CID	1140 of 1093	5757	estradiol	ROOT MODALITIY:	3 of 4	Inhibitor	Active	1	1	1 (ChEMBL	1 :	16309907						
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	3 of 4	Inhibitor	Active	1	1	1 (ChEMBL	1 :	16309907	ROOT OUTCOME:	1 of 1	1	1		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	3 of 4	Inhibitor	Active	1	1	1 (ChEMBL	1 :	16309907	SUB OUTCOME:	1 of 1	1	1	INFO	1 of 1
SUB CID	1140 of 1093	5757	estradiol	ROOT MODALITIY:	4 of 4	Affinity	Active	1	1	2 (ChEMBL	2 1	7448656	17890084					
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	4 of 4	Affinity	Active	1	1	2 (ChEMBL	2 1	17448656	ROOT OUTCOME:	1 of 2	1	2		
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	4 of 4	Affinity	Active	1	1	2 (ChEMBL	2 1	7448656	SUB OUTCOME:	1 of 2	1	2	INFO	1 of 2
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	4 of 4	Affinity	Active	1	1	2 (ChEMBL	2 1	7448656	SUB OUTCOME:	1 of 2	1	2	INFO	2 of 2
SUB CID	1140 of 1093	5757	estradiol	SUB MODALITIY:	4 of 4	Affinity	Active	1	1	2 (ChEMBL	2 1	7448656	ROOT OUTCOME:	2 of 2	2	1		
4																			

2 ChEMBL

Affinity

Active

2 17448656 SUB OUTCOME:

1 INFO: 1 of 1

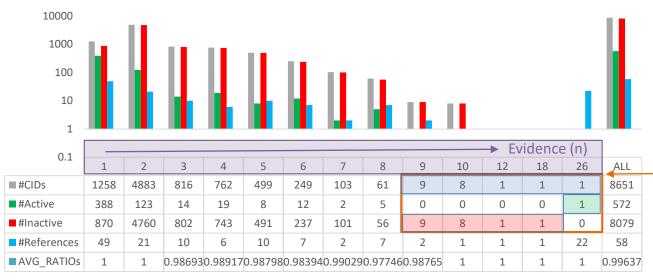
Grouping Format: flat file filtering

Grouping Sch	CITIC
	Filtering by INFO Lines (view results and retains hit-call
Eiltoring by De	oot Modality (view hit calls and hides results)

Hit-Call Summary: Choosing Confidence Thresholds

Hit-calls can be divided by the **modality** and binned by **confidence/reproducibility metrics**, such as the number **(n)** of results (evidences) used in each hit-call or **% agreement**.

8,651 chemical hit-calls for hAR-agonist modality binned by Evidence (n).



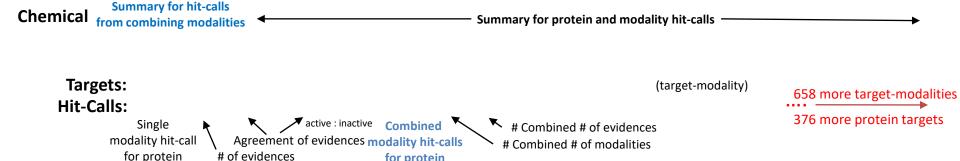
e.g.,

There are 8,651 total chemicals tested for the agonist modality with an (n) of at least 1.

A selection grid of n > or = 9 yields: 20 chemicals out of 8,651 1 active out of 572 19 inactive out of 8,079.

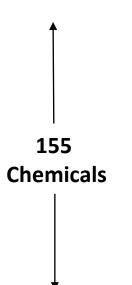
This means that each hit call derived from this selection will have at least 9 separate evidences (n). The lowest AVG Ratio of agreement for a bin in this selection is 98.77% (n=9).

Protein Hit-Calls for a Chemical



Protein Hit-Calls for 155 TSCA Chemicals

Combined Modality Hit-calls for 578 Protein Targets
Bisphenol A [Active] = 15 : [Inactive] = 289
summary /



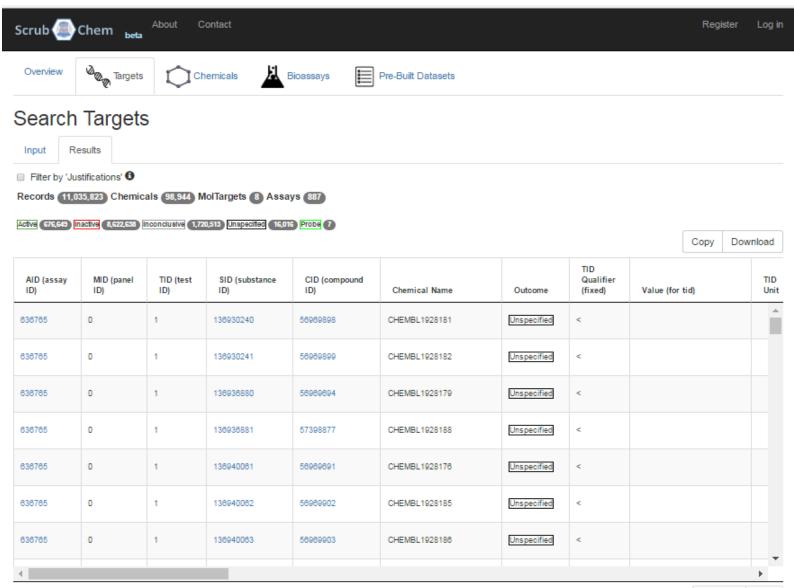
ScrubChem.org: Home Page

www.ScrubChem.org							

Searching Data: Input

1. Select a **Search Tab** Category Scrub Chem beta About Contact Targets Overview Bioassays Pre-Built Datasets Chemicals Search Targets Scrub Chem beta Contact Input Targets Overview Bioassays Chemicals Pre-Built Datasets Select an Identifier: Gene Symbol Search Targets Accession Number Gene Symbol Gene ID Input Gene Name Full Gene Name Select an Identifier: Search Gene Symbol Input ID: 2. Select an Identifier esr ESR₁ ESR 1|ESR 2 ESR₂ ESR 2|ESR 1 3. Type input and select **ESR**RA from the autocomplete **ESRRB ESRRG**

Searching Data: Results

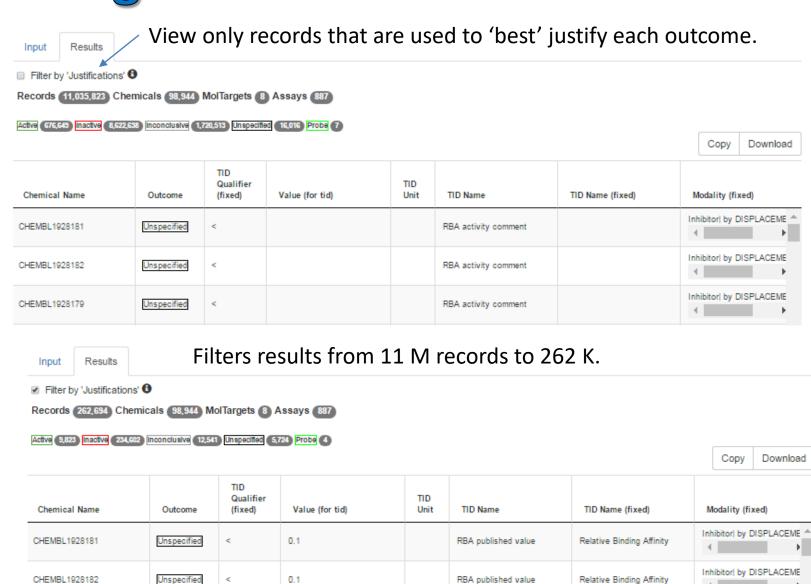


Filtering Results: Justifications

CHEMBL1928179

Unspecified

0.1



RBA published value

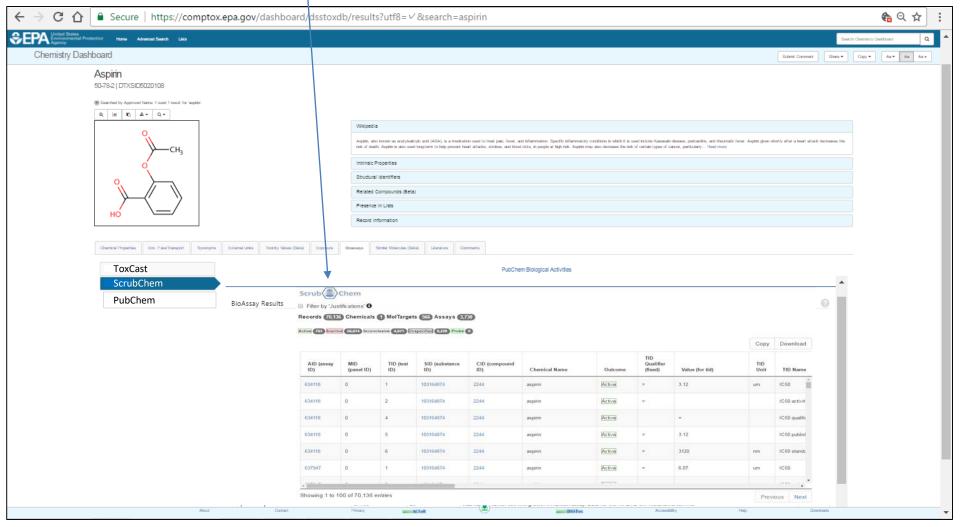
Inhibitor| by DISPLACEME

Relative Binding Affinity

Embed ScrubChem.org Tables

iframe of https://www.scrubchem.org/Home/Results?CIDs=2244

EPA's CompTox Dashboard (to be added)



API Access to Database

https://www.scrubchem.org/api/QueryApi/GetResults?Accs=1017&start=0&take=10&getJustifications=true



This XML file does not appear to have any style information associated with it. The document tree is shown below.

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LIVE DEMOS

ScrubChem.org

https://www.scrubchem.org

ScrubChem API

https://www.scrubchem.org/api/QueryApi/GetResults?Accs=1017&start=0&take=10&getJustifications=true

ScrubChem Embed

https://www.scrubchem.org/Home/Results?Accs=1017

EPA CompTox Dashboard (to be added)

https://comptox.epa.gov/dashboard/dsstoxdb/results?search=aspirin

Conclusions

ScrubChem Accomplishments:

- Accesses millions of assay records.
- Programmatically identifies & corrects data issues (systemic and anecdotal)
 - Adds critical annotations (e.g., modality & justifications) and implements concepts (hit calls) needed for aggregating data from different assays into datasets.
- Provides online access to the database and datasets.

In Progress:

- Improving assay annotation and code (iterative cleaning).
- Expanding vocabularies and ontology needed to better standardize endpoints, targets, and system information (grow scope of database).
- Reviewing hit calls (improving the methodology and scope).
- Model/Analysis/Tools (implement datasets)!
- Enhance web access (open to ideas!).
- Publish & Continued Support!

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Alexander Tropsha & Olexandr (Oles) Isayev

University of North Carolina- Chapel Hill Eshelman School of Pharmacy

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