

# US-EPA Chemicals Dashboard — an integrated data hub for environmental science

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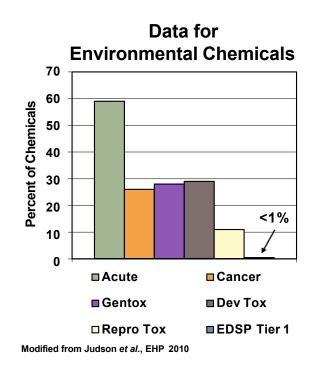
## Problem: Too Many Chemicals and Too Few Resources



- Fast characterization of human and ecological risk posed by existing and emerging chemicals is a critical challenge
- Chemistry never stops. But there is sparse and distributed data...



CAS REGISTRY® contains more than 171 million unique organic and inorganic chemical substances, such as alloys, coordination compounds, minerals, mixtures, polymers and salts, and more than 68 million protein and DNA sequences



## Solution



- Develop a "first-stop-shop" for environmental chemical data to support EPA and partner decision making:
  - Centralized location for relevant chemical data
  - Chemistry, exposure, hazard and dosimetry
  - Combination of existing data and predictive models
  - Publicly accessible, periodically updated, curated
- Easy access to data improves efficiency and ultimately accelerates chemical risk assessment

## If We Database Chemical Structures...

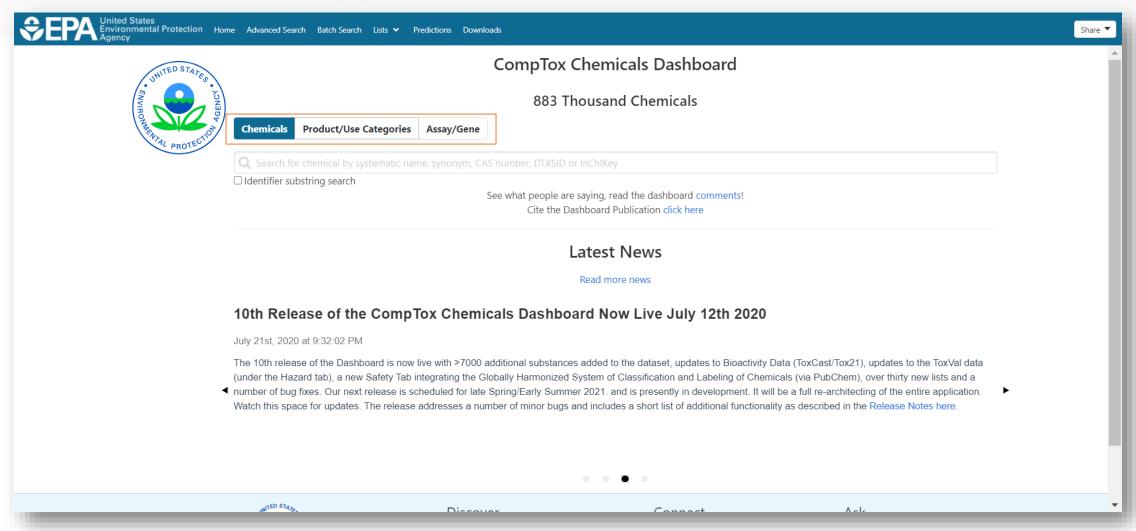


- ...then we can search the dataset by inherent structural properties
  - Formula
  - Mass
  - Substructure
  - Structural similarity
- ...we can integrate other info into the database for retrieval
- …available data, both experimental and predicted, is a click away
- ...data can be downloaded, distributed and shared
- ...linking out to other resources enabled by adopting specific standards
- ...structure collections, with associated data, are available for modeling

## CompTox Chemicals Dashboard



### 883k Chemical Substances



### **BASIC Search**



**Product/Use Categories** Chemicals Assay/Gene Q Benzo(a)pyrene Benzo(a)pyrene DTXSID2020139 Benzo(a)pyrene diolepoxide 1 DTXSID9036779 Benzo(a)pyrene-7,8,9-triol,7,8,9,10-tetrahydro-, (7-alpha,8-beta,9-beta)-DTXSID00210066 Benzo(a)pyrene-1-methanol DTXSID40235374 Benzo(a)pyrene-1,6-dione, 7-methyl-DTXSID70229645 Benzo(a)pyrene-10-methanol DTXSID20235817 Benzo(a)pyrene-10-sulfonic acid, 7,8,9,10-tetrahydro-7,8,9-trihydroxy-, (7alpha,8beta,9beta DTXSID80154378 Benzo(a)pyrene-11,12-diol DTXSID70215609 Benzo(a)pyrene-11,12-diol, 11,12-dihydro-, cis-DTXSID20214501

- Type ahead search using Names, synonyms and CASRNs
- Millions of identifiers
- Substring search

#### Search Results

Searched with 'Synonym Substring': Benzo(A)Pyrene

183 chemicals

## Search for classes of chemicals

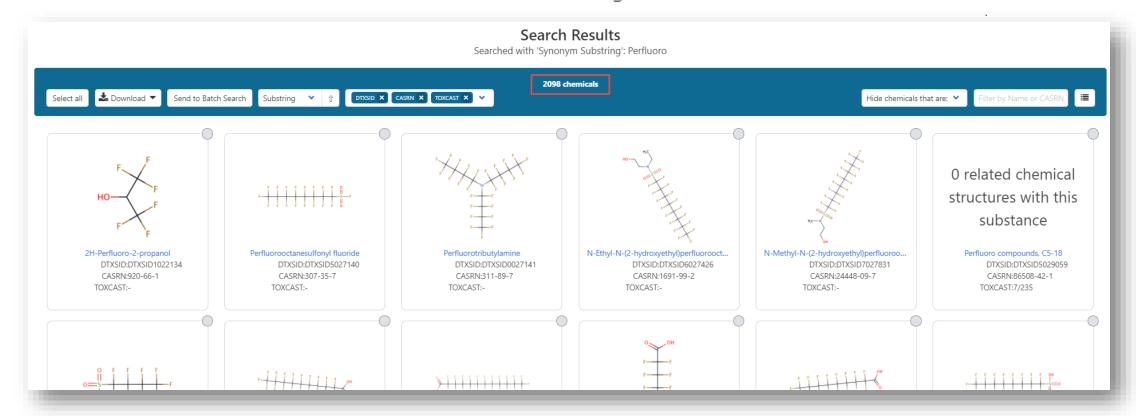


• Examples: "perfluoro"

Chemicals Product/Use Categories Assay/Gene

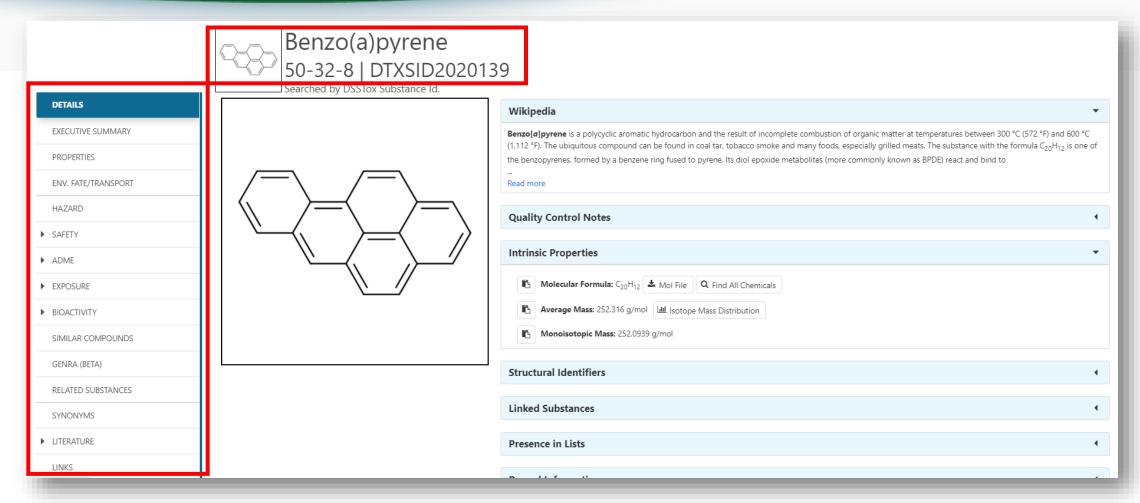
Q perfluoro

✓ Identifier substring search



## Detailed Chemical Pages One more identifier – the DTXSID

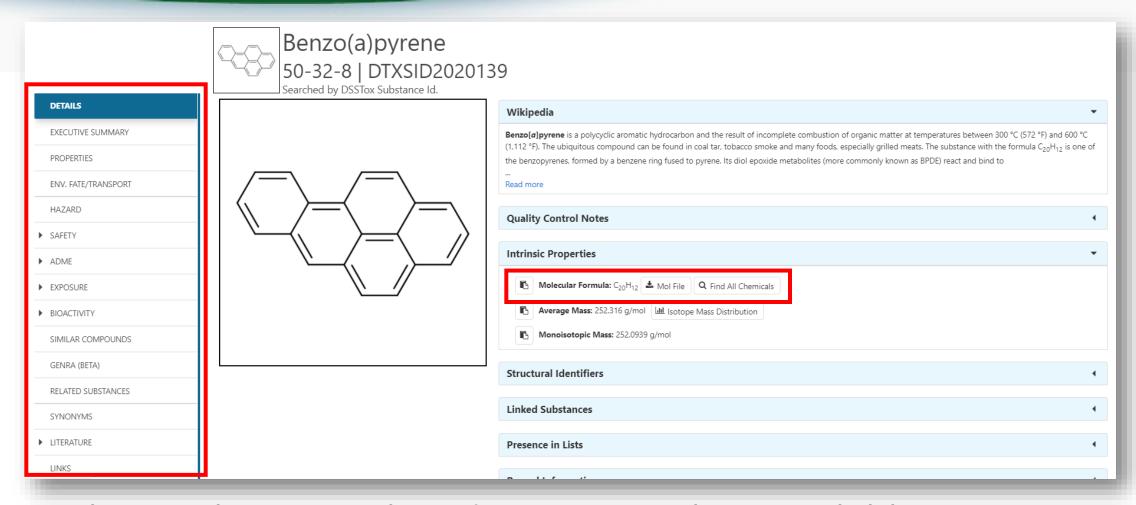




• Chemical page: Wikipedia snippet when available, intrinsic properties, structural identifiers, linked substances

# Detailed Chemical Pages Easy Navigation

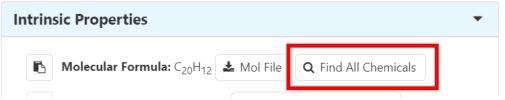




• Chemical page: Wikipedia snippet when available, intrinsic properties, structural identifiers, linked substances

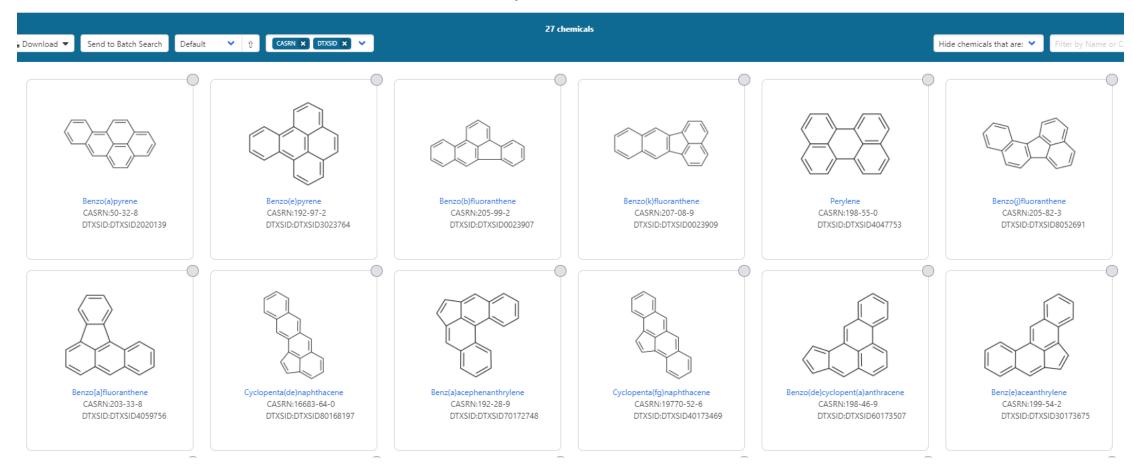
# From the Chemical Details Page... all chemicals with same FORMULA





#### Search Results

Searched by Exact Molecular Formula: C20H12.



# How many chemicals are associated through LINKED SUBSTANCES?



- Atrazine, is a herbicide in MANY commercial products
- The dashboard has salt forms, isotopically labelled forms, multicomponent forms
- How do we identify what they are???

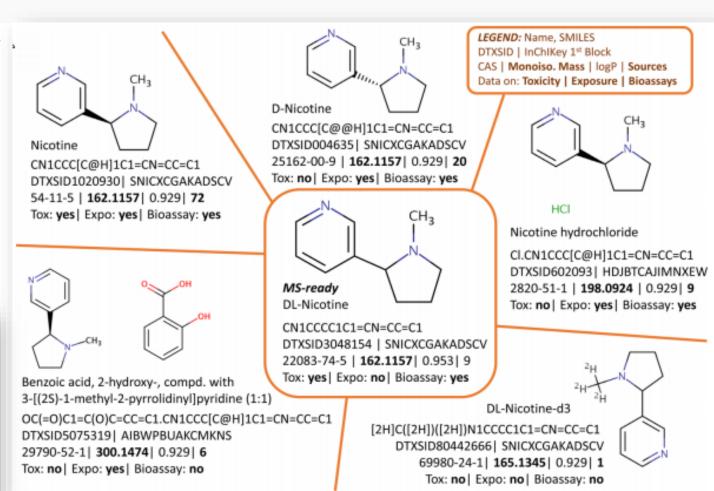


### Linked Substances



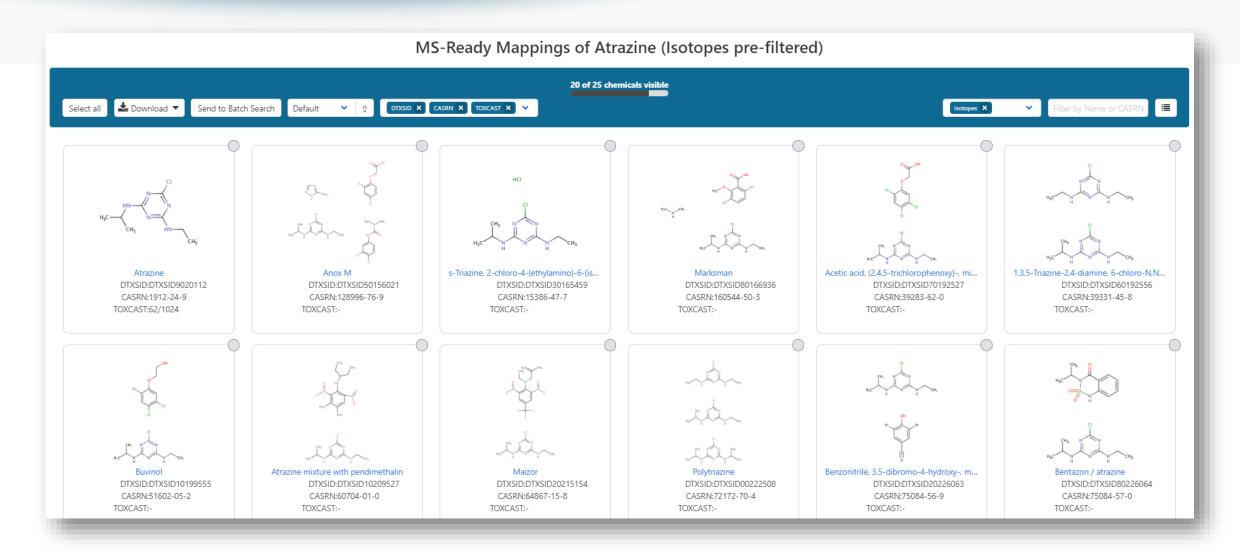
- We map chemicals together using cheminformatics approaches
- Use desalting, destereo, split multicomponents etc to map chemicals together





## Atrazine Linked Substances



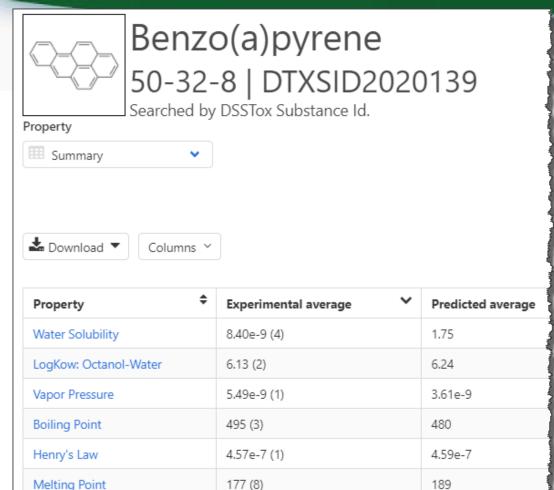




# Experimental and Predicted Data

## **Experimental and Predicted Data**





53.9

234

1.28

Surface Tension

Flash Point

Density

- Physchem and Fate & Transport experimental and predicted data
- Data can be downloaded as Excel, TSV and CSV files

- Predictions: multiple algorithms
  - TEST: Toxicity Estimation Software Tool
  - OPERA: OPEn structure—activity/ property Relationship App
  - Other commercial algorithms

## QSAR modeling



- What do you trust more? Experimental or predicted data?
- Do you trust individual models or consensus models
- What if there are no experimental data, how good are predictions?

# Data Curation Pipelines plus Manual Curation Processes



> SAR QSAR Environ Res. 2016 Nov;27(11):939-965. doi: 10.1080/1062936X.2016.1253611.

An automated curation procedure for addressing chemical errors and inconsistencies in public datasets used in QSAR modelling

K Mansouri <sup>1 2</sup>, C M Grulke <sup>2</sup>, A M Richard <sup>2</sup>, R S Judson <sup>2</sup>, A J Williams <sup>2</sup>

Research article | Open Access | Published: 08 March 2018

## OPERA models for predicting physicochemical properties and environmental fate endpoints

Kamel Mansouri <sup>™</sup>, Chris M. Grulke, Richard S. Judson & Antony J. Williams

Journal of Cheminformatics 10, Article number: 10 (2018) Cite this article

9195 Accesses | 90 Citations | 25 Altmetric | Metrics

# Property and Fate and Transport Data ~25 MILLION pre-predicted values



- We have built QSPR models based on tens of thousands of property data points curated over the past decade
- We push our "QSAR-Ready" chemical structures through predictions to produce property predictions

```
"MS-Ready" structures for non-targeted high-resolution mass spectrometry screening studies

Andrew D. McEachran , Kamel Mansouri, Chris Grulke, Emma L. Schymanski, Christoph Ruttkies & Antony J. Williams

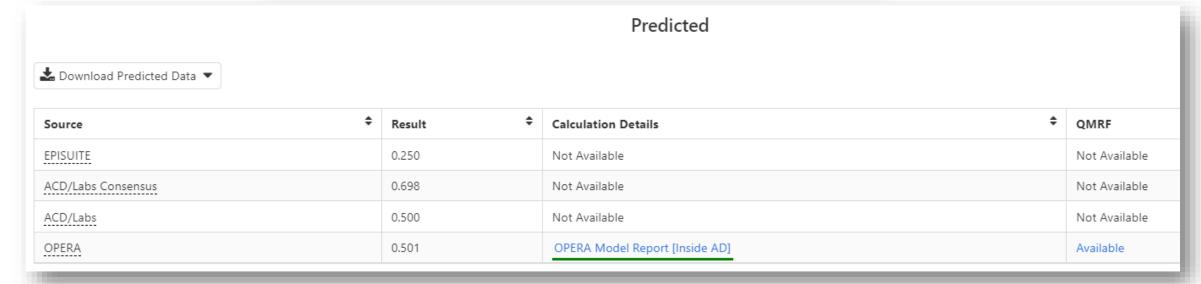
Journal of Cheminformatics 10, Article number: 45 (2018) | Cite this article

4640 Accesses | 34 Citations | 13 Altmetric | Metrics
```

## Access to Predictions

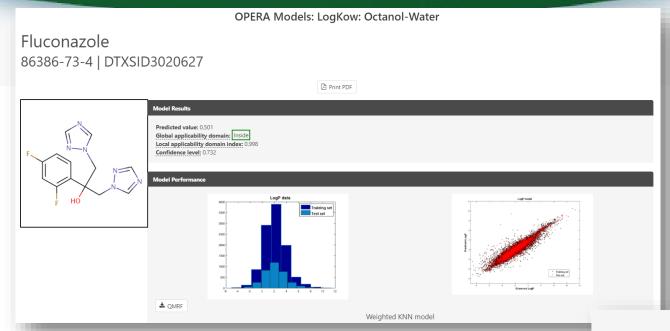






## **OPERA Reports**

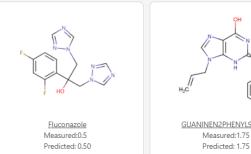


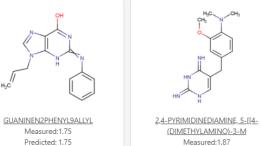


#### Weighted KNN model

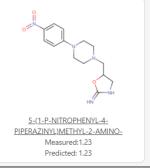
5-fold CV (75%)		Training (75%)		Test (25%)	
Q2	RMSE	R2	RMSE	R2	RMSE
0.850	0.690	0.860	0.670	0.860	0.780

#### Nearest Neighbors from the Training Set





Predicted: 1.87



## Similar reports for TEST predictions

#### Predicted Normal boiling point for 80-05-7 from Consensus method

#### Prediction results

Endpoint	Experimental value	Predicted value	
Normal boiling point °C	N/A	359.93	

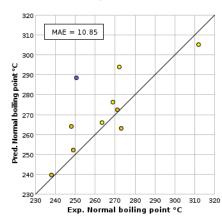
	Individual Predictions					
	Method	Predicted value °C				
Hi	ierarchical clustering	372.06				
Gı	roup contribution	377.41				
Ne	earest neighbor	330.33				



Predictions for the test chemical and for the most similar chemicals in the external test set

If the predicted value matches the experimental values for similar chemicals in the test set (and the similar chemicals

#### Prediction results (colors defined in table below)



Chemicals	MAE*
Entire set	11.46
Similarity coefficient ≥ 0.5	10.85

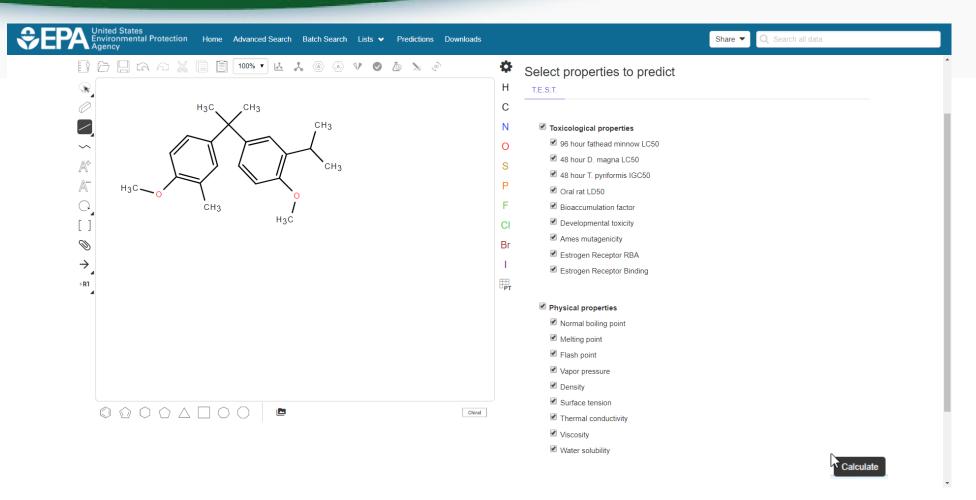
<sup>\*</sup>Mean absolute error in °C



CAS	Structure	Similarity Coefficient	Experimental value °C	Predicted value °C
80-05-7 (test chemical)	165 CO46		N/A	359.93
14938-35-3	NC.	0.81	250.50	288.54
28994-41-4	HO	0.75	312.00	305.28
96-76-4	H,C CH,	0.71	263.50	265.93
4130-42-1	H <sub>S</sub> C CH <sub>S</sub> CH <sub>S</sub> CH <sub>S</sub> CH <sub>S</sub> CH <sub>S</sub>	0.70	272.00	293.96
616-55-7	H <sub>2</sub> C CH <sub>3</sub> CH <sub>3</sub> CH <sub>3</sub>	0.70	269.00	276.42
2052-14-4	45	0.69	271.00	272.30

## Real-Time Predictions





## Toxicity and Properties



- ✓ Toxicological properties
  - ✓ 96 hour fathead minnow LC50
  - 48 hour D. magna LC50
  - ✓ 48 hour T. pyriformis IGC50
  - ✓ Oral rat LD50
  - Bioconcentration factor
  - Developmental toxicity
  - ✓ Ames mutagenicity
  - Estrogen Receptor RBA
  - ✓ Estrogen Receptor Binding

- ✓ Physical properties
  - ✓ Normal boiling point
  - ✓ Melting point
  - ✓ Flash point
  - ✓ Vapor pressure
  - Density
  - Surface tension
  - ✓ Thermal conductivity
  - ✓ Viscosity
  - ✓ Water solubility

## Real-Time Predictions



United States Environmental Protection Agency	Home Advanced Search Ba	tch Search Lists V Predict	ions Downloads		Share ▼	Q Search all data
Provider: T.E.S.T.						Calculate
■ Download Summary						
Property	Experimental Value	Consensus	Hierarchical clustering	Single model	Group contribution	Nearest neighbor
96 hour fathead minnow LC50		6.051 -Log10(mol/L) 0.278 mg/L	5.678 -Log10(mol/L) 0.656 mg/L	5.572 -Log10(mol/L) 0.836 mg/L	5.908 -Log10(mol/L) 0.386 mg/L	7.047 -Log10(mol/L) 0.028 mg/L
48 hour D. magna LC50		5.591 -Log10(mol/L) 0.802 mg/L	5.548 -Log10(mol/L) 0.884 mg/L	6.169 -Log10(mol/L) 0.212 mg/L	5.518 -Log10(mol/L) 0.948 mg/L	5.128 -Log10(mol/L) 2.329 mg/L
48 hour T. pyriformis IGC50		5.590 -Log10(mol/L) 0.804 mg/L	6.390 -Log10(mol/L) 0.127 mg/L		5.588 -Log10(mol/L) 0.806 mg/L	4.790 -Log10(mol/L) 5.068 mg/L
Oral rat LD50		2.400 -Log10(mol/kg) 1243.951 mg/kg	2.232 -Log10(mol/kg) 1829.942 mg/kg			2.568 -Log10(mol/kg) 845.609 mg/kg
Bioaccumulation factor		3.066 Log10 1164.438	3.090 Log10 1230.849	2.717 Log10 521.420	3.257 Log10 1806.262	3.200 Log10 1585.959
Developmental toxicity		true	true	true		true
Ames mutagenicity		false	false			false
Estrogen Receptor RBA		-0.710 Log10 0.195	-1.692 Log10 0.020	-1.515 Log10 0.031		1.077 Log10 11.931
Estrogen Receptor Binding		false	false	false		true
Normal boiling point		345.2 °C	306.6 °C		408.2 °C	320.7 °C
Melting point		74.3 °C	63.8 °C		41.0 °C	118.2 °C
Flash point		161.7 °C	143.5 °C		152.7 °C	188.9 °C
Vapor pressure		-5.955 Log10(mmHg) 1.109*10^-6 mmHg	-5.534 Log10(mmHg) 2.925*10^-6 mmHg		-5.903 Log10(mmHg) 1.249*10^-6 mmHg	-6.428 Log10(mmHg) 3.735*10^-7 mmHg
Density		0.959 g/cm³	0.977 g/cm³		0.843 g/cm <sup>3</sup>	1.057 g/cm³



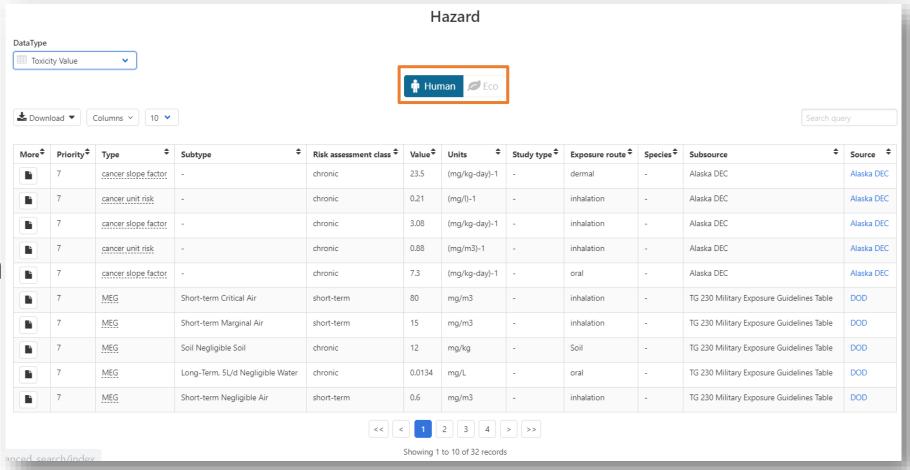
# Toxicity Data (in vitro and in vivo)

## Chemical Hazard Data



## **ToxVal Database**

- >50k chemicals
- >770k tox. values
- >30 sources of data
- ~5k journals cited
- ~70k citations

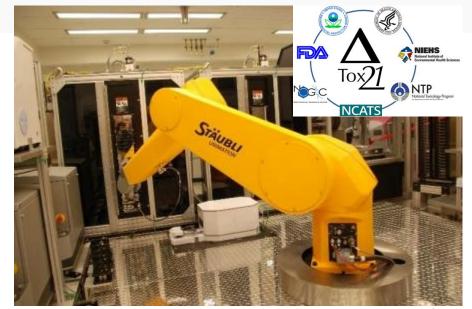


## ToxCast and Tox21 bioactivity data for hazard screening and prediction.



#### **EPA's ToxCast program at a glance**





Tox21 robot

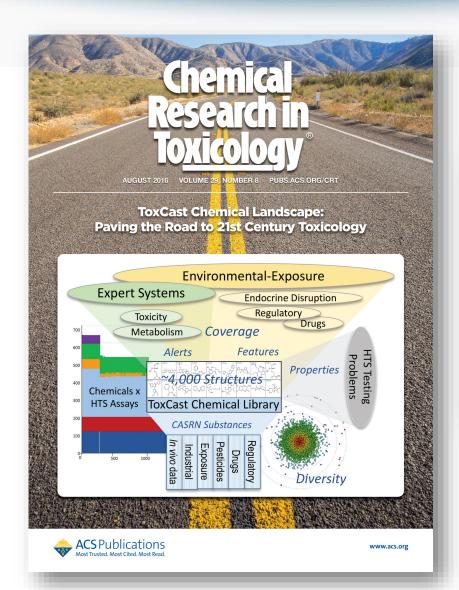


Compare to Database of Animal Toxicity Studies (ToxRefDB) 30 years/\$2 billion of animal tests

- ToxCast: more assays, fewer chemicals, EPA-driven
- Tox21: fewer assays, mostly 1536, driven by consortium
- All Tox21 data are analyzed by multiple partners
- Tox21 data is available analyzed in the ToxCast Data Pipeline and other pipelines as well

## **ToxCast**





## ToxCast Chemical Landscape: Paving the Road to 21st Century Toxicology

Ann M. Richard<sup>\*†</sup>, Richard S. Judson<sup>†</sup>, Keith A. Houck<sup>†</sup>, Christopher M. Grulke<sup>†</sup>, Patra Volarath<sup>‡</sup>, Inthirany Thillainadarajah<sup>§</sup>, Chihae Yang<sup>||⊥</sup>, James Rathman<sup>⊥#</sup>, Matthew T. Martin<sup>†</sup>, John F. Wambaugh<sup>†</sup>, Thomas B. Knudsen<sup>†</sup>, Jayaram Kancherla<sup>▽</sup>, Kamel Mansouri<sup>▽</sup>, Grace Patlewicz<sup>†</sup>, Antony J. Williams<sup>†</sup>, Stephen B. Little<sup>†</sup>, Kevin M. Crofton<sup>†</sup>, and Russell S. Thomas<sup>†</sup>

#### View Author Information ✓

Publication Date: July 1, 2016  $\scriptstyle \vee$ 

https://doi.org/10.1021/acs.chemrestox.6b00135

Article Views

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Altmetric

244

Citations





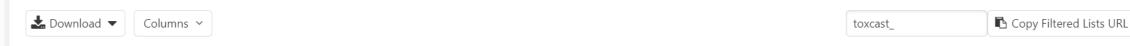
Add to Export

LEARN ABOUT THESE METRICS

## ToxCast Chemicals and Assays



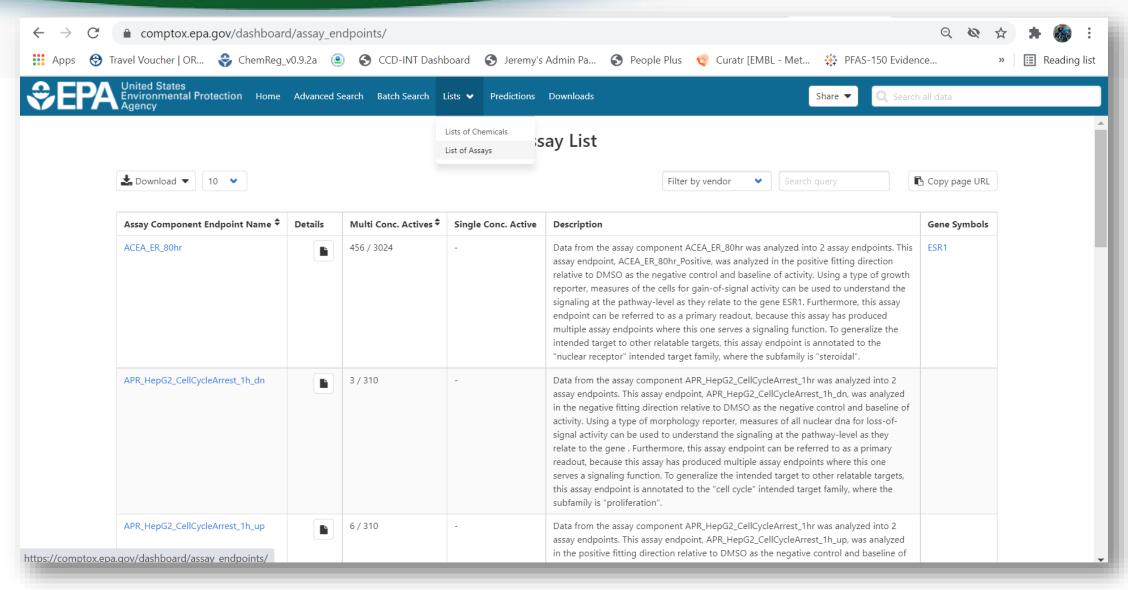
### **Select List**



List Acronym	List Name	Last Updated 🕏	Number of Chemicals	List Description
TOXCAST_PH1V2	TOXCAST_ph1v2 - EPA ToxCast Screening Library (ph1v2 Subset)	2016-01-25	293	TOXCAST_ph1v2 is the ph1v2 subset of TOXCAST, a reprocured subset of Phase I (ph1v1) chemicals moved into Phase II and later testing phases of the ToxCast program.
TOXCAST_PHASEI	TOXCAST_Phasei - EPA ToxCast Screening Library (Phase I subset)	2016-01-29	310	TOXCAST_Phasel corresponds to the ph1v1 subset of TOXCAST (mostly pesticides) screened in Phase I of the ToxCast program.
TOXCAST_PH2	TOXCAST_ph2 - EPA ToxCast Screening Library (ph2 Subset)	2016-01-25	768	TOXCAST_ph2 is the ph2 subset of TOXCAST, added in Phase II of the ToxCast program to increase chemical diversity and coverage of chemicals of concern to EPA programs.
TOXCAST_E1K	TOXCAST_e1k - EPA ToxCast Screening Library (e1k Subset)	2016-01-25	799	TOXCAST_e1k is the e1k subset of TOXCAST, selected for screening in endocrine-related assays.
TOXCAST_PHASEII	TOXCASST_PhaseII - EPA ToxCast Screening Library (Phase II Subset)	2016-01-29	1864	TOXCAST_PhaseII is the full set of chemicals screened in Phase II of the ToxCast program, consisting of TOXCAST_ph1v2, ph2 and e1k sublists.
TOXCAST_PH3	TOXCAST_ph3 - EPA ToxCast Screening Library (ph3 subset)	2018-04-11	2678	TOXCAST_ph3 is the ph3 subset of TOXCAST, added to the most recent Phase III of the ToxCast program to further increase chemical diversity and coverage of chemicals of concern to EPA programs.
TOXCAST_PHASEIII	TOXCAST_PhaseIII - EPA ToxCast Screening Library (Phase II Subset)	2017-04-11	4584	TOXCAST_PhaseIII is the full set of chemicals available for screening in Phase III of the ToxCast program, consisting of the majority of chemicals screened in Phase II and newly added ph3

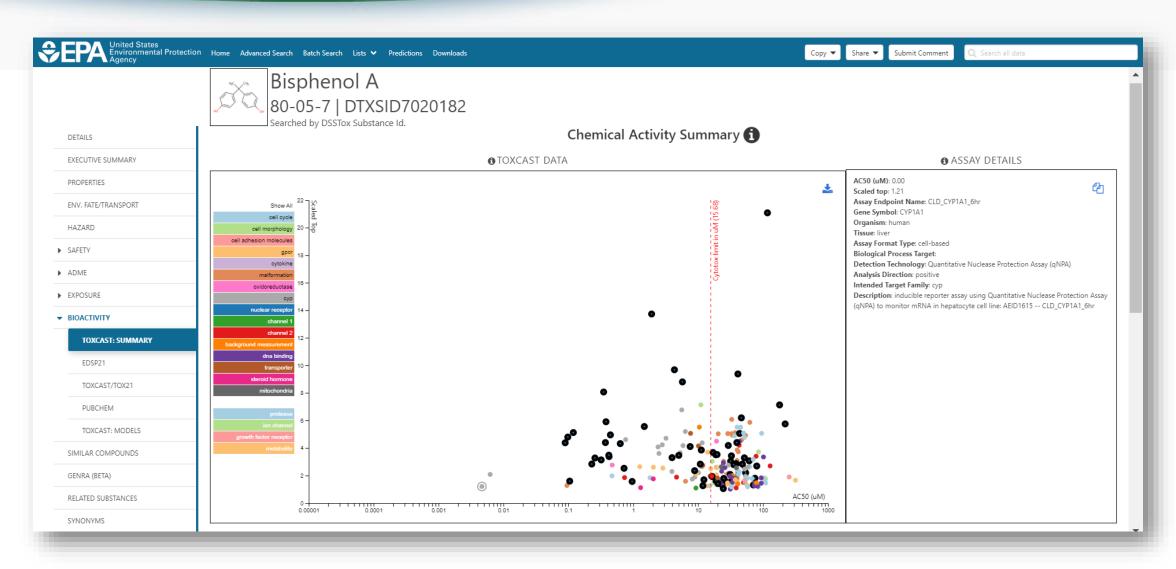
## ToxCast Assays





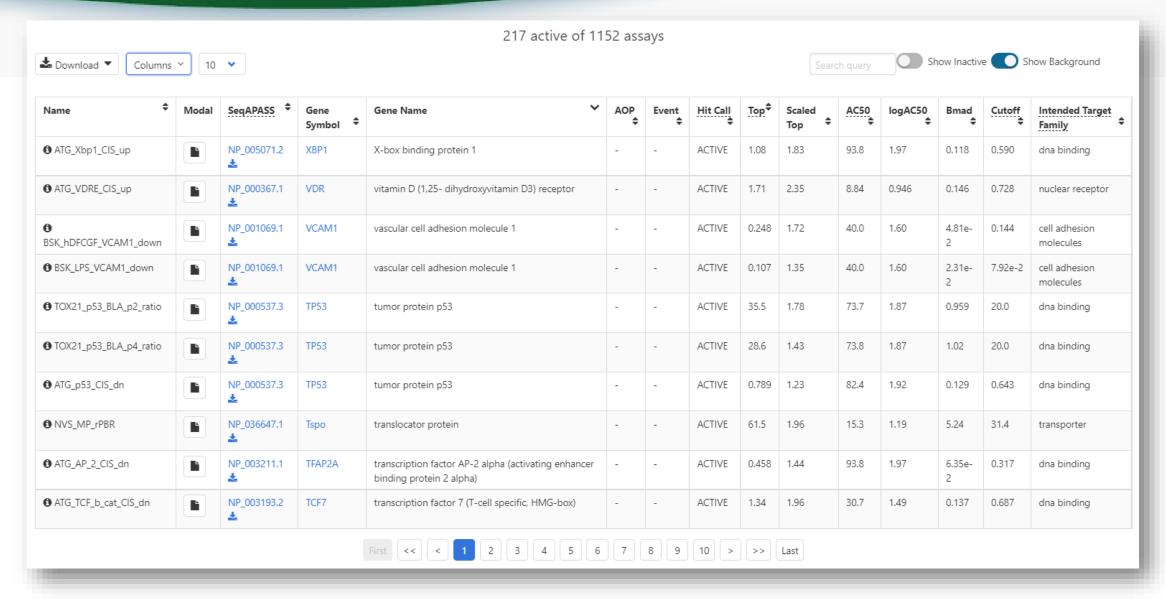
## Lets look at the data





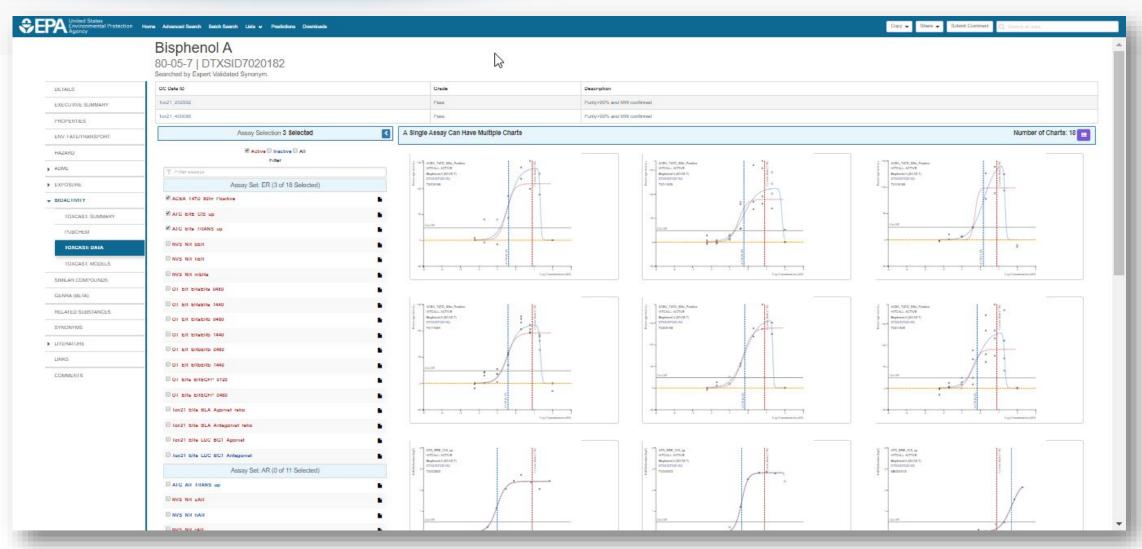
## Rich data tables – full transparency





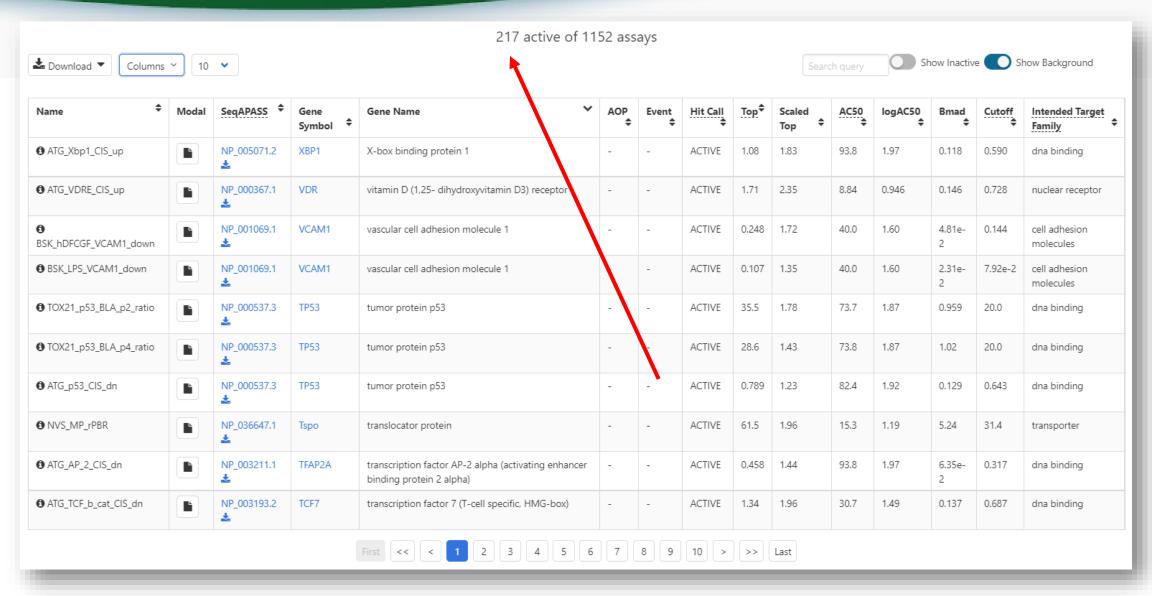
## Bioactivity Data (ToxCast/Tox21) Data below for Bisphenol A





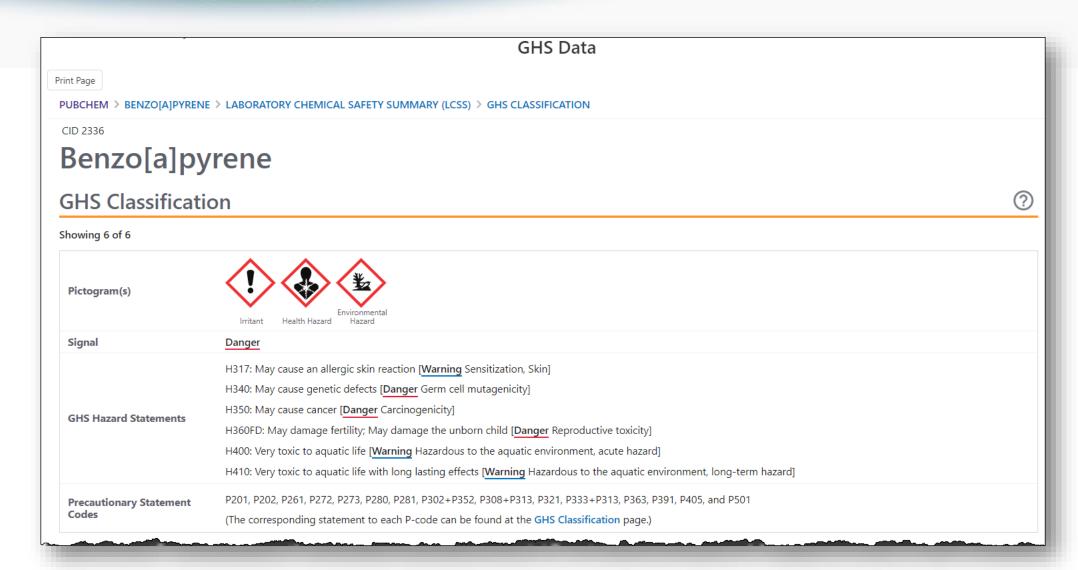
## #Actives for a chemical





## Safety Data





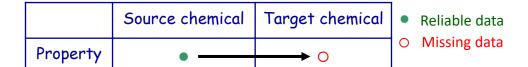


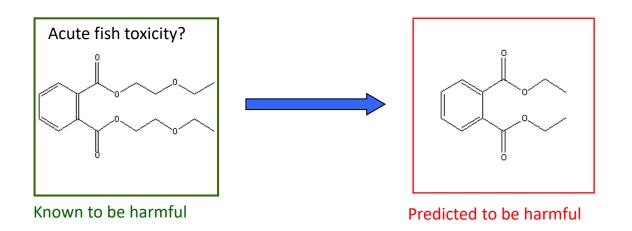
# Generalized Read-Across

# Definitions: Read-Across



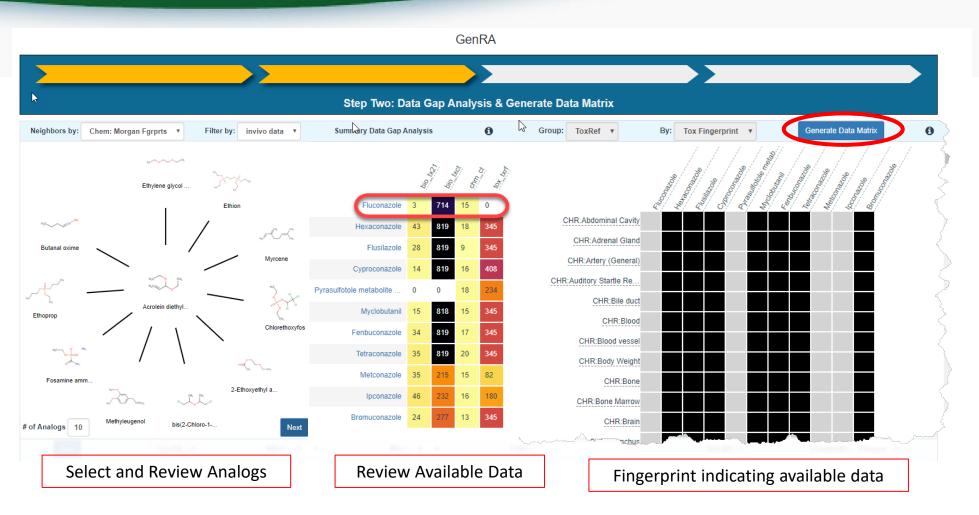
 Known information on the property of a substance (source) is used to make a prediction of the same property for another substance (target) that is considered "similar"





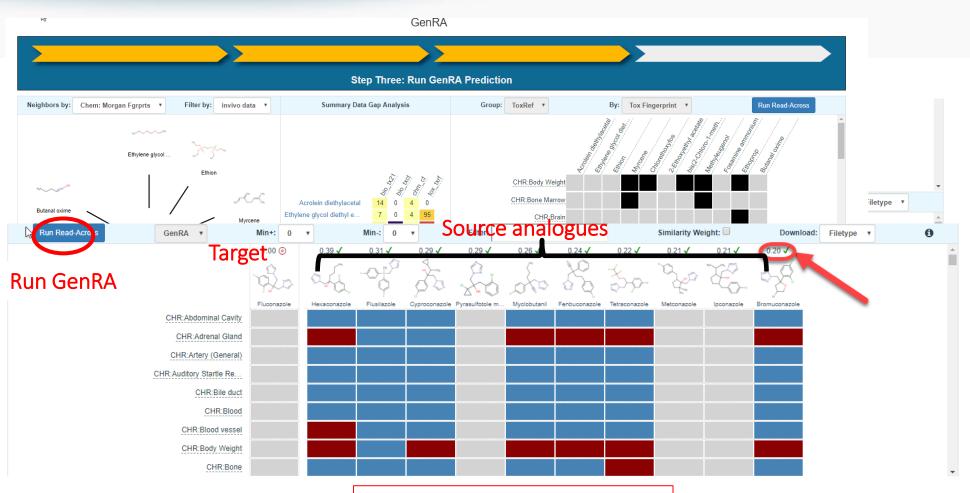
# GenRA (Generalised Read-Across)





# GenRA (Generalised Read-Across)





Red : Toxicity effects.

Blue: No Toxicity effects

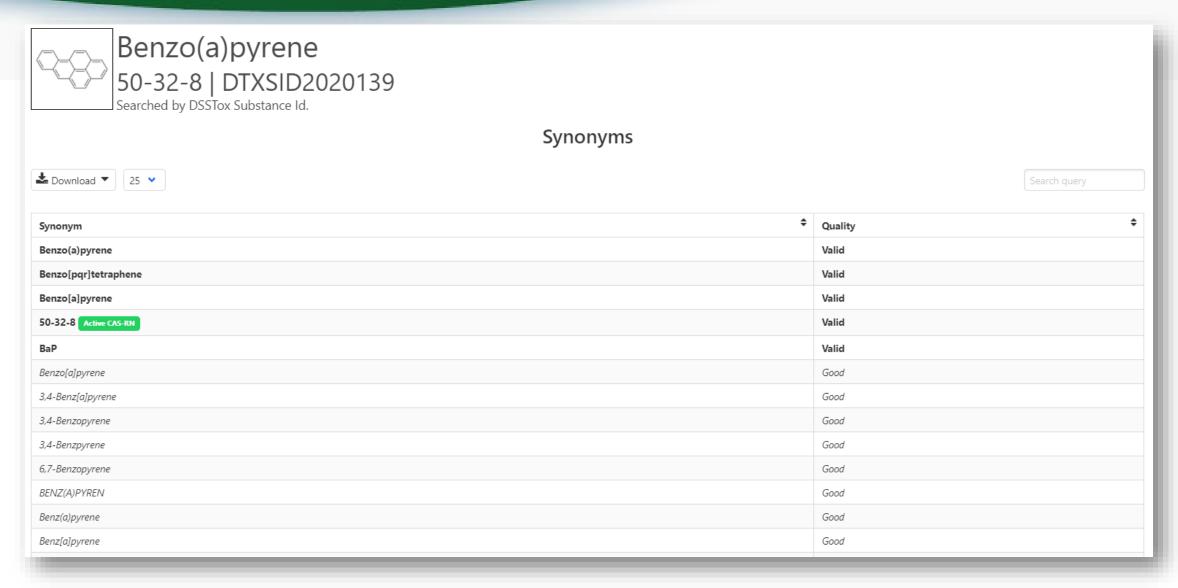
Grey : Absence of data



# Identifiers and Nomenclature

# Identifiers Support Searches in other systems





# Challenges with Nomenclature



- Be CAREFUL with names! There is a LOT of confusion in the public domain. CHOOSE sources wisely!
- There are MANY public databases but not many are curated
- All public databases have value but not many curate data

 Example: METHANE on PubChem <u>https://pubchem.ncbi.nlm.nih.gov/compound/297</u>

# CAS Registry Numbers on PubChem



#### 2.3.1 CAS



74-82-8

▶ CAMEO Chemicals; CAS Common Chemistry; ChemIDplus; DrugBank; EPA Chemicals under the TSCA; EPA DSSTox; European Chemicals Agency (ECH...

8006-14-2

▶ CAMEO Chemicals; EPA Chemicals under the TSCA; EPA DSSTox; European Chemicals Agency (ECHA)

7440-44-0

▶ ChemIDplus

7782-40-3

▶ ChemIDplus

7782-42-5

▶ ChemIDplus

16291-96-6

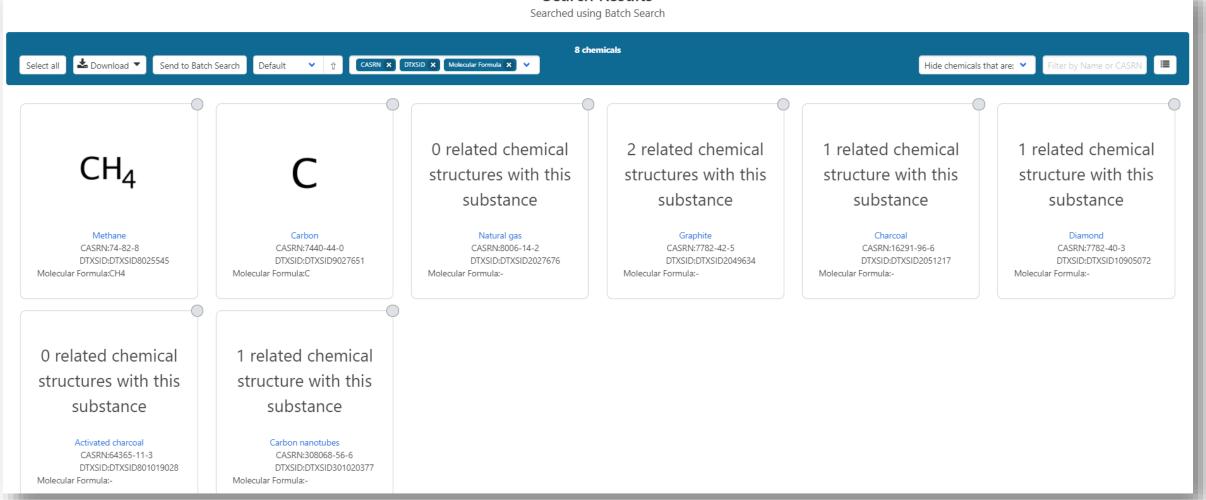
▶ ChemIDplus

64365-11-3

# CASRN lookup on the dashboard







# Methane is Diamond and Nanotubes?



• These are all Depositor Names for Methane 😊

### 2.4.2 Depositor-Supplied Synonyms





UN 1971 (Salt/Mix) UN 1972 (Salt/Mix) Activated carbon, pellets 3mm Graphene quantum dots(Powder) Multiwall Nanotubes 5-15 nm GO quantum dots(C: 1mg/ml) MWNTs ethyl acetate suspension Reduced Graphene Oxide@ SnO2 Carbon nanotubes aqueous slurry

Fullerene soot, (as produced) MWNTs Butyl acetate suspension QuadraPure C, 0.3-0.8mm 6GRV67N0U2 GO quantum dots yellow(Powder) Graphene electric aqueous slurry Graphene powder Physical methods Reduced Graphene Oxide@ Co3O4 Carbon Conductive Adhesive Tapes

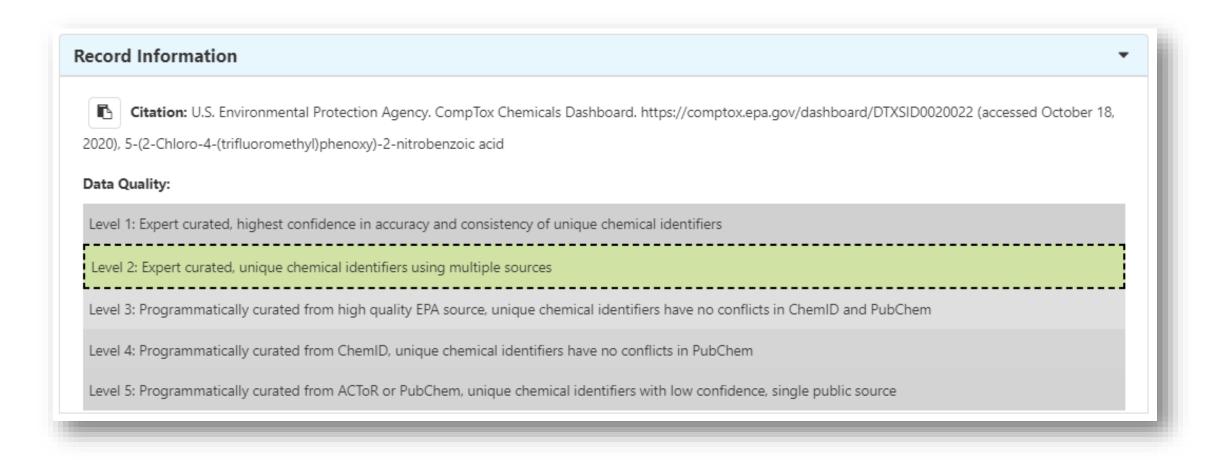
Carbon Nanotube sponges XFCN01 Carbon Nanotube sponges XFCN07 Carbon Nanotube sponges XFCN08 Carbon, activated, -4+8 mesh Carbon, activated, 2mm & down CHEMBL2106049 Diamond Synthesized, 95% Nano Diethyl Cyanomethyl Phosphonate DTXSID8025545

DTXSID9027651 Graphite electrode, rotrode disc Carbon conductive cement adhesive Conductive Flexible TPU Filament GO quantum dots yellow(1mg/ml) Graphite powder, -20+84 mesh Carbon black, Super P Conductive DTXSID50179391 NanoIntegris metallic SWCNTs70%

# A little more about our data quality

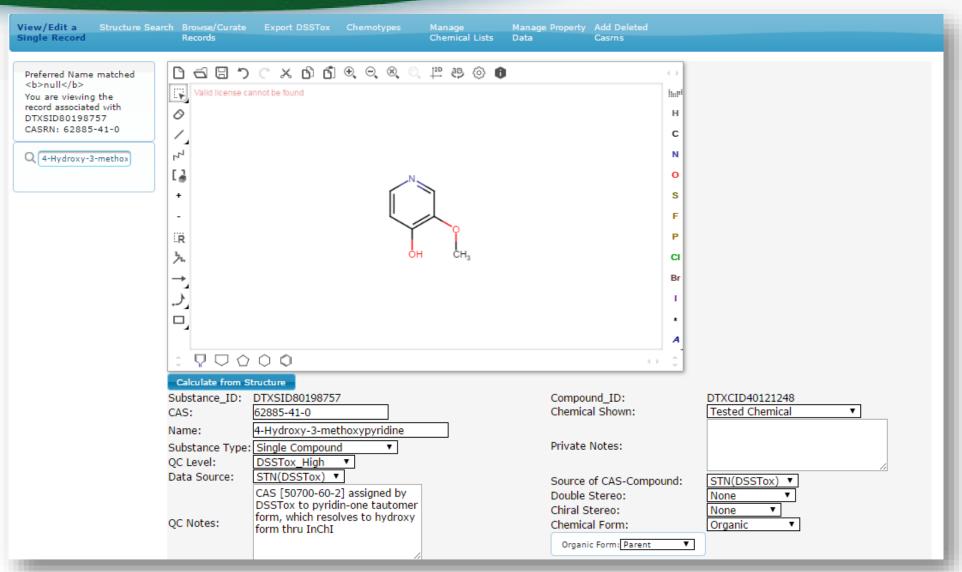


Five full time curators register and curate data to elevate quality



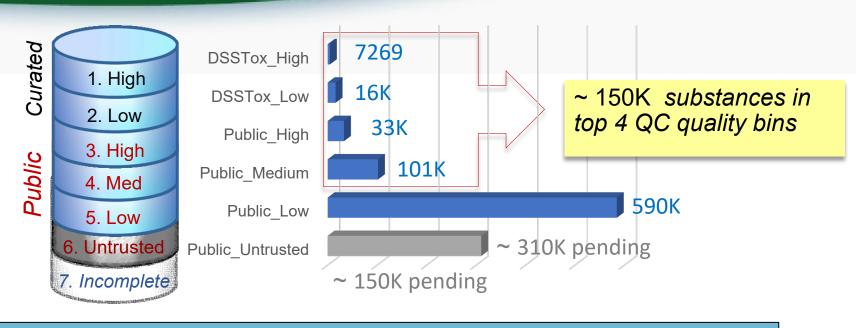
# Underneath the Dashboard





# Distribution of curated data Now at >1.2 MILLION substances





### QC Levels

DSSTox\_High: Hand curated and validated

DSSTox\_Low: Hand curated and confirmed using multiple public sources

Public\_High: Extracted from EPA SRS and confirmed to have no conflicts in ChemID and PubChem

Public\_Medium: Extracted from ChemID and confirmed to have no conflicts in PubChem

Public\_Low: Extracted from ACToR or PubChem

Public\_Untrusted: Postulated, but found to have conflicts in public sources

# A little more about our data quality



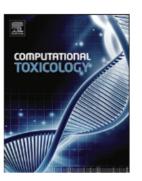
Computational Toxicology 12 (2019) 100096



Contents lists available at ScienceDirect

### Computational Toxicology





EPA's DSSTox database: History of development of a curated chemistry resource supporting computational toxicology research



Christopher M. Grulke<sup>a</sup>, Antony J. Williams<sup>a</sup>, Inthirany Thillanadarajah<sup>b</sup>, Ann M. Richard<sup>a,\*</sup>

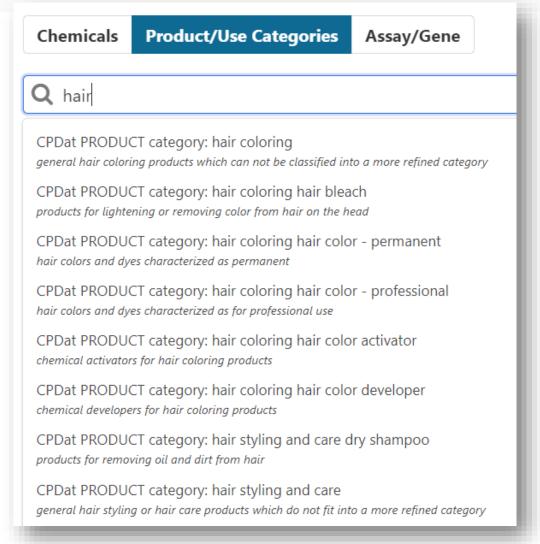
<sup>&</sup>lt;sup>a</sup> National Center for Computational Toxicology, Office of Research & Development, US Environmental Protection Agency, Mail Drop D143-02, Research Triangle Park, NC 27711, USA

<sup>&</sup>lt;sup>b</sup> Senior Environmental Employment Program, US Environmental Protection Agency, Research Triangle Park, NC 27711, USA

# **Products Searching**



# What chemicals are in hair care products?



# Sources of Exposure to Chemicals





### Benzo(a)pyrene 50-32-8 | DTXSID2020139

Searched by DSSTox Substance Id.

Chemical Weight Fractions 1





Columns Y 10 V



Product Name	Product Use Category	Minimum Weight Fraction	Maximum Weight Fraction	Data Type	Source
m-525-1-5x pah mixtures 0.5 mg/ml for method 525	Not Yet Categorized:			MSDS	SIRI
mm6125 surface conditioner	Not Yet Categorized:			Health Product Declaration	Health Product Declaration Collaborative
monolithic membrane 6125 (mm6125) / monolithic membrane	Not Yet Categorized:			Health Product Declaration	Health Product Declaration Collaborative
organic potablewatr pw 32_component h:reg semi-volatile 690	Not Yet Categorized:	0.00	1.00e-3	MSDS	SIRI
polynuclear aromatic hydrocarbon mixture_ep84627	Not Yet Categorized:			MSDS	SIRI
prestone(r) power steering fluid	engine maintenance: auto fluids and additives			MSDS	CPCPdb
r-12 shield tite wet surface coating	Not Yet Categorized:	0.00	0.500	MSDS	SIRI
sea tar 1010_ 0028	Not Yet Categorized:			MSDS	SIRI
supelpreme-hc kit pah mix_ 48909	Not Yet Categorized:			MSDS	SIRI
supelpreme-hc pah mix 1ml_ 48905	Not Yet Categorized:			MSDS	SIRI



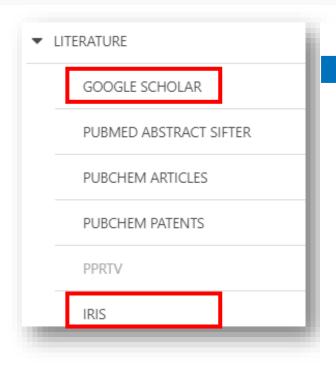


# Toxicity Reports and Literature Searching

# Identifiers are used in the app



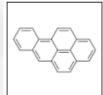
Identifiers are used to feed and link into "Literature"





# Literature Searching

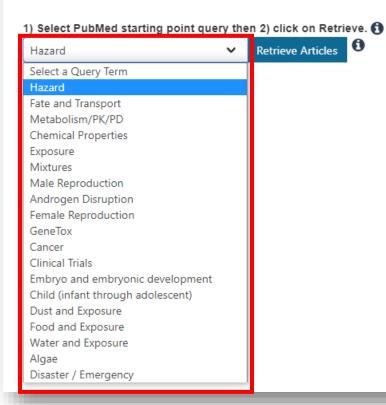




# Benzo(a)pyrene 50-32-8 | DTXSID2020139

Searched by DSSTox Substance Id.

### **Abstract Sifter**



Optionally, edit the query before retrieving.	
("50-32-8" OR "Benzo(a)pyrene") AND (NOAEL OR NOEL OR LOEL OR Rfd OR "reference dose" OR "reference concentration" OR "adverse effect level"[tiab] OR "cancer slope factor"[tiab])	
/.	

- Real-time retrieval of data from PubMed ~30 million abstracts and growing)
- Choose from set of pre-defined queries
- Adjust and fine tune queries based on interests

# Literature Searching



- "Sifting" of results using multiple terms
- Frequency counting terms
- Color highlighting of terms
- Download list to Excel
- Send list to PubMed for downloading ref. file
- Direct link via PubMed ID

dermal cancer		ncer			e C	lear Terms		Download / Send to   Download Sifter for	A EXCO		
	dermal	cancer ↓	pyrene	Total	PMID	Year	Title	Aut	hors	Journal	Rev
וכ	0	7	1	8	23922326	2013	Using immunotoxicity information to improve cancer	er risk a	Zaccaria; McClure	International journal of toxicology	√
5	8	7	2	17	16632147	2006	Development of a dermal cancer slope factor for b	enzo[a]	Knafla; Phillipps; Brecher; Petrovic; Richardson	Regulatory toxicology and pharmacology : RTP	✓
וכ	4	6	2	12	33359623	2020	Testing the validity of a proposed dermal cancer sl	ope fac	Magee; Forsberg	Regulatory toxicology and pharmacology : RTP	√
5	0	5	1	6	28477805	2017	Pollution characteristics, sources and lung cancer	risk of	Wang; Xia; Wu; Zhang; Sun; Yin; Zhou; Yang	Journal of environmental sciences (China)	
5	4	4	2	10	20888881	2010	Development and application of a skin cancer slop	e factor	Knafla; Petrovic; Richardson; Campbell; Rowat	Regulatory toxicology and pharmacology : RTP	
	4	4	1	9	16307791	2005	Health risk assessment on human exposed to env	ironme	Chen; Liao	The Science of the total environment	
5	2	4	1	7	11807932	2002	Cancer risk assessment for oral exposure to PAH	mixtures.	Schneider; Roller; Kalberlah; Schuhmacher-Wolz	Journal of applied toxicology : JAT	
5	2	3	1	6	32460055	2020	PAHs in Chinese atmosphere Part II: Health risk a	ssessm	Ma; Zhu; Liu; Jia; Yang; Li	Ecotoxicology and environmental safety	
5	0	3	1	4	23379661	2013	Parent and halogenated polycyclic aromatic hydro	carbon	Ni; Guo	Journal of agricultural and food chemistry	$\top$
5	0	3	1	4	20800879	2010	Health risk assessment on dietary exposure to pol	ycyclic	Xia; Duan; Qiu; Liu; Wang; Tao; Jiang; Lu; Song; H	Hu The Science of the total environment	
5	2	3	1	6	16293284	2005	Probabilistic risk assessment for personal exposure to car		Liao; Chiang	Chemosphere	
	0	2	1	3	17544483	2007	Health risk assessment for traffic policemen exposed to p		Hu; Bai; Zhang; Wang; Zhang; Yu; Zhu	The Science of the total environment	
	0	1	1	2	28795279	2017	Human health risk assessment and PAHs in a stre	tch of ri	Srivastava; Sreekrishnan; Nema	Environmental monitoring and assessment	
	0	1	1	2	12634119	2003	Deviation from additivity in mixture toxicity: relevan	nce of n	Lutz; Vamvakas; Kopp-Schneider; Schlatter; Stop	per Environmental health perspectives	
	0	1	2	3	3709501	1986	The adsorption of polyaromatic hydrocarbons on n	atural a	Menard; Noel; Khorami; Jouve; Dunnigan	Environmental research	
7	0	0	1	1	33136306	2020	Effects on Apical Outcomes of Regulatory Relevan	nce of F	Crump: Boulanger: Farhat: Williams: Basu: Hecke	r: Environmental toxicology and chemistry	

#### Development of a dermal cancer slope factor for benzo[a] pyrene.

Polycyclic aromatic hydrocarbons (PAHs) are commonly found at environmentally impacted sites in both Canada and the United States, and also occur naturally. Typically, benzo[a] pyrene (B[a]P) is selected as a standard to which the cancer potencies of other carcinogenic PAHs are compared. Cancer potency estimates for B[a]P have been published for the oral and inhalation routes of exposure, however, no such estimate has been established by a regulatory agency for dermal exposure. The main objectives of the current investigation were to: evaluate approaches used to examine the relative carcinogenicity of PAHs; to conduct a review of mammalian dermal carcinogenicity studies for B[a]P and derive a cancer slope factor for dermal exposure to PAHs using B[a]P as a surrogate for other PAHs. The toxicological database of dermal B[a]P studies was examined for relevant animal bloassays. Seven relevant studies were identified. A cancer slope factor for B[a]P was developed using the benchmark dose approach and the linearized multistage model. The upper 95th C1 at the 5% effect level above background incidence was used as the point of departure for low-dose linear extrapolation. An average slope factor of 0.55 (microg/animal day)(-1) was calculated for mice, which was converted to a dose-equivalent slope factor of 25 (mg/kg day)(-1). This latter slope factor is proposed for application to human health risk assessment with no scaling adjustment. Dermal potency equivalency factor values were identified which may be used with other carcinogenic PAH in the calculation of total B[a]P equivalent dermal cancer risk estimates. An identified area for further investigation is the consideration of scaling in extrapolating the calculated dermal cancer slope factor from mice to humans.



# External Links

# What's the best way to search the internet for chemical data?



- We know how complex chemicals identifiers are...
  - CASRN(s)
  - Hundreds of names (maybe)
  - SMILES
  - InChIs
  - EINECS, EC numbers
- What can WE do to help you navigate the internet?

# External Links – Also use Identifiers Names, CASRN, PubChem IDs, InChls.





### Benzo(a)pyrene 50-32-8 | DTXSID2020139

Searched by DSSTox Substance Id.

#### General

- **EPA Substance Registry Service**
- PubChem
- Chemspider
- CPCat
- DrugBank
- W Wikipedia
- Q MSDS Lookup
- ChEMBL
- ToxPlanet
- ACS Reagent Chemicals
- ₩ Wolfram Alpha
- ECHA Infocard
- ChemAgora
- Consumer Product Information Database
- ChEBI
- NIST Chemistry Webbook
- **WEBWISER**
- PubChem Safety Sheet
- Consumer Product Information Database
- PubChem: Chemical Vendors

### Toxicology

- ACToR
- он<sub>е</sub> DrugPortal
- CCRIS
- ChemView
- **©** CTD
- eChemPortal
- Gene-Tox
- HSDB
- ACToR PDF Report
- CREST
- National Air Toxics Assessment
- ECOTOX
- ChemView
- Chemical Checker
- ☑ BindingDB
- CalEPA OEHHA
- MIOSH IDLH Values
- LactMed
- ECOTOX

#### **Publications**

- Toxline
- PPRTVWFB
- PubMed
- IRIS Assessments
- EPA HERO
- NIOSH Skin Notation Profiles
- NIOSH Pocket Guide
- RSC Publications
- BioCaddie DataMed
- Springer Materials
- Bielefeld Academic Search Engine
- CORE Literature Search
- Google Books (Text Search)
- Google Patents (Text search)
- G Google Scholar (Text search)
- Google Patents (Structure search)
- Google Books (Structure Search)
- Google Scholar (Structure search)
- Federal Register

#### Analytical

- RSC Analytical Abstracts
- ♠ Tox21 Analytical Data
- MONA: MassBank North America
- mzCloud
- NIST IR Spectrum
- NIST MS Spectrum
- MassBank
- NIST Antoine Constants
- IR Spectra on PubChem
- NIST Kovats Index values
- ☑ Protein DataBank
- National Environmental Methods Index

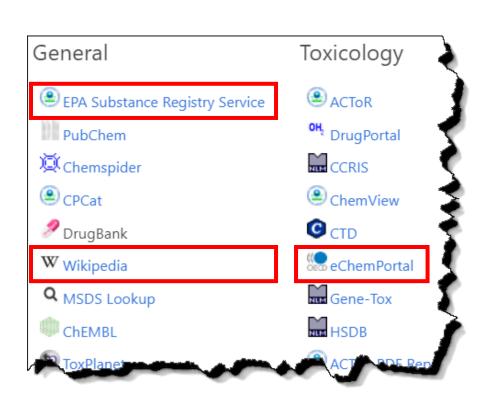
#### Prediction

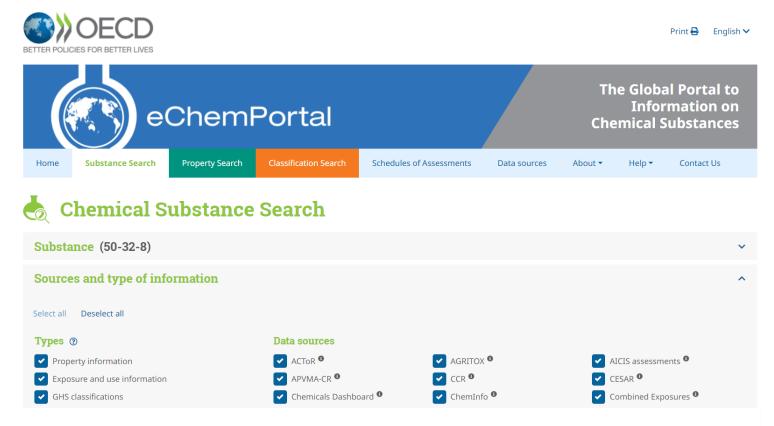
- 2D NMR HSQC/HMBC Prediction
- Carbon-13 NMR Prediction
- Proton NMR Prediction
- ChemRTP Predictor
- **€** LSFRD

### **External Links**



 Links to ~90 websites providing access to additional data on the chemical of interest



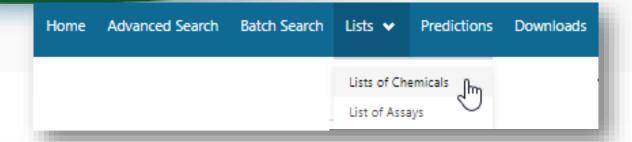




# Chemical Lists and Categories

# >300 Chemical Lists (and growing)





List Acronym 🕏	List Name	Last Updated 🕏	Number of Chemicals ♥	List Description
HDXEXCH	MASSPECDB: Hydrogen Deuterium Exchange Standard Set - Under HDX Conditions	2018-11-07	592	Observed species (deuterated and undeuterated) from the HDXNOEX under hydrogen deuterium exchange conditions (Ruttkies, Schymansk al. in prep.)
HDXNOEX	MASSPECDB: Hydrogen Deuterium Exchange Standard Set - No Exchange	2018-11-07	765	Environmental standard set used to investigate hydrogen deuterium exchange in small molecule high resolution mass spectrometry (Ruttki Schymanski et al. in prep.)
MASSBANKEUSP	MASSPECDB: MassBank.EU Collection: Special Cases	2017-07-16	263	The MassBank.EU list contains curated chemicals (Schymanski/William associated with the literature/tentative/unknown/SI spectra available of MassBank.EU that are not available as part of the full MassBank collection of reference standard spectra.
MASSBANKREF MASSPECDB: MassBank 2017 Reference Spectra Collection		2017-07-13	1267	This MassBank list contains chemicals associated with the full MassBan collection of reference standard spectra available on MassBank.EU, MassBank.JP and MassBank of North America as well as the Open Dat collection, curated by Williams/Schymanski.
MYCOTOXINS	MASSPECDB: Mycotoxins from MassBank.EU	2017-08-02	88	This is a set of mycotoxins, initiated by the contribution of spectra of 9 mycotoxins to MassBank.EU by Justin Renaud and colleagues from Agriculture and Agri-Food Canada, Government of Canada

# PFAS lists of Chemicals



Copy Filtered Lists URL

### **Select List**

PFAS



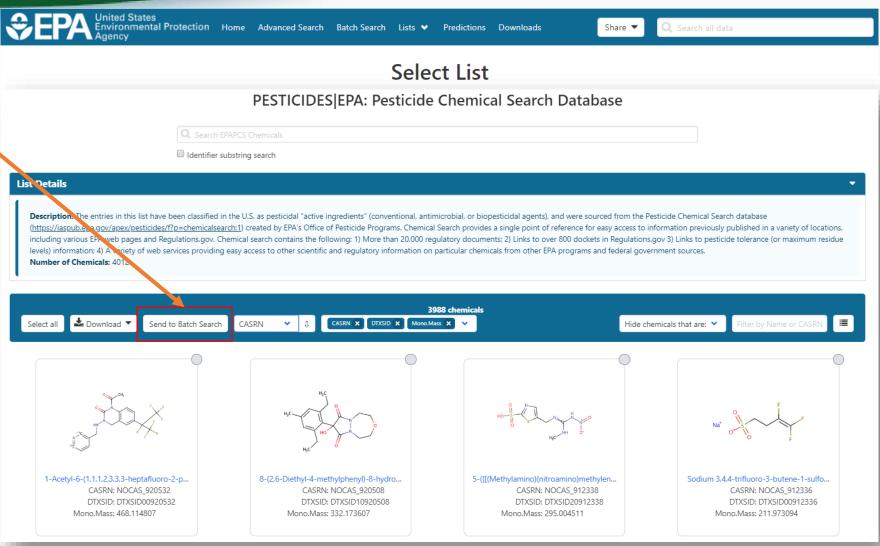
List Acronym	List Name \$	Last Updated 🕏	Number of Chemicals 🕏	List Description
EPAPFAS75S1	PFAS EPA: List of 75 Test Samples (Set 1)	2018-06-29	74	PFAS list corresponds to 75 samples (Set 1) submitted for initial testing screens conducted by EPA researchers in collaboration with researchers at the National Toxicology Program.
EPAPFAS75S2	PFAS EPA: List of 75 Test Samples (Set 2)	2019-02-21	75	PFAS list corresponds to a second set of 75 samples (Set 2) submitted for testing screens conducted by EPA researchers in collaboration with researchers at the National Toxicology Program.
EPAPFASCAT	PFAS EPA Structure- based Categories	2018-06-29	64	List of registered DSSTox "category substances" representing PFAS categories created using ChemAxon's Markush structure-based query representations.
EPAPFASINSOL	PFAS EPA: Chemical Inventory Insoluble in DMSO	2018-06-29	43	PFAS chemicals included in EPA's expanded ToxCast chemical inventory found to be insoluble in DMSO above 5mM.
EPAPFASINV	PFAS EPA: ToxCast Chemical Inventory	2018-06-29	430	PFAS chemicals included in EPA's expanded ToxCast chemical inventory and available for testing.
EPAPFASRL	PFAS EPA: Cross-Agency Research List	2017-11-16	199	EPAPFASRL is a manually curated listing of mainly straight-chain and branched PFAS (Per- & Poly-fluorinated alkyl substances) compiled from various internal, literature and public sources by EPA researchers and program office representatives.
PFASKEMI	PFAS: List from the Swedish Chemicals Agency (KEMI) Report	2017-02-09	2416	Perfluorinated substances from a Swedish Chemicals Agency (KEMI) Report on the occurrence and use of highly fluorinated substances.
PFASMASTER	PFAS Master List of PFAS Substances	2018-07-26	5061	PFASMASTER is a consolidated list of PFAS substances spanning and bounded by the below lists of current interest to researchers and regulators worldwide.
PFASOECD	PFAS: Listed in OECD Global Database	2018-05-16	4729	OECD released a New Comprehensive Global Database of Per- and Polyfluoroalkyl Substances, (PFASs) listing more than 4700 new PFAS
PFASTRIER	PFAS Community- Compiled List (Trier et al., 2015)	2017-07-16	597	PFASTRIER community-compiled public listing of PFAS (Trier et al, 2015)

## **Curated List of Pesticides**



Find list of interest

 Select list and send to batch





# Batch Searching

# **Batch Searching**



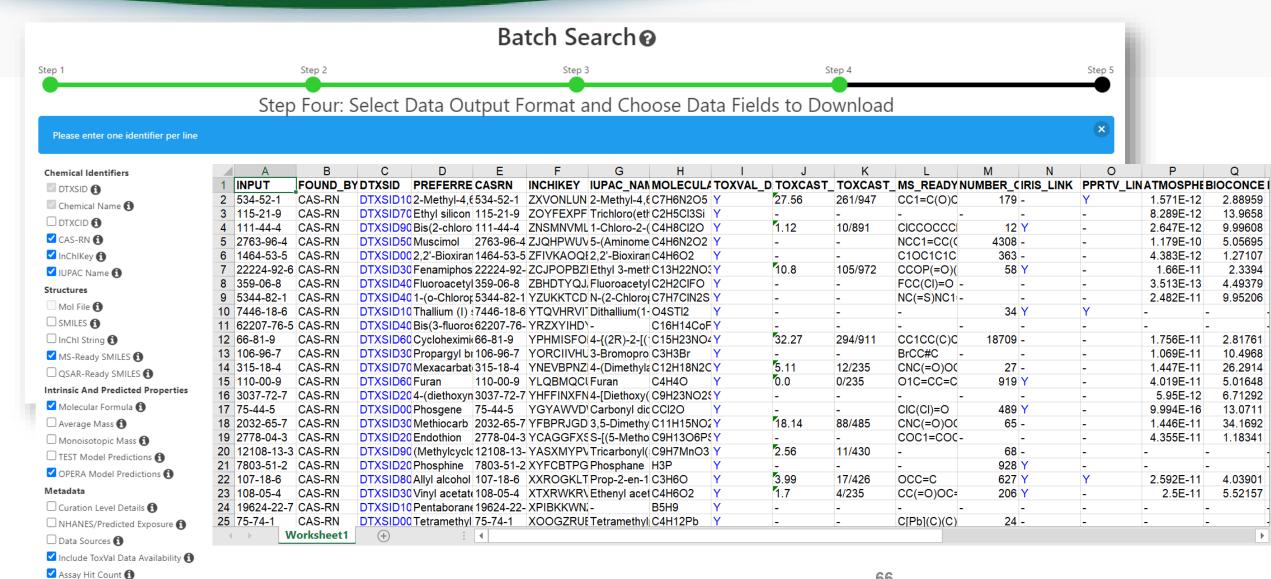
- Singleton searches are great but...
- ...we generally want data on LOTS of chemicals!

- Typical questions
  - What are the structures for a set of chemical names? Set of CASRNs?
  - Can I get chemical lists in Excel files? As a list of SMILES strings?
     Can I get an SDF file?
  - Can I include predicted properties in the download file? OPERA? TEST?
  - Are "these chemicals" screened in Toxcast?
  - I'm a mass spectrometrist and need masses and formulae for a list of chemicals

### Batch Search CASRNs

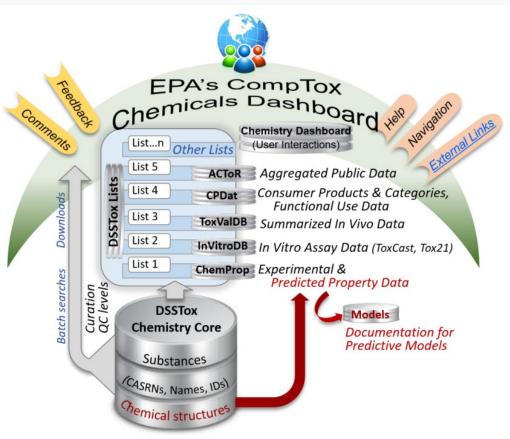
✓ Number of PubMed Articles ♠



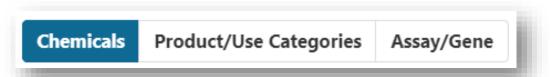


# **Summary and Conclusion**





- CompTox Chemicals Dashboard a central hub for environmental data
  - ~900k chemical substances
  - Integrating property data, hazard data, exposure data, in vitro bioactivity data
  - Interrogation of bioactivity data -
  - Multiple types of searches



- Batch search for thousands of chemicals
- Real-time property and toxicity predictions
- Downloadable files CSV, TSV and Excel

# Recommended Reading





### **Environment International**

Volume 154, September 2021, 106566



Review article

Sourcing data on chemical properties and hazard data from the US-EPA CompTox Chemicals Dashboard: A practical guide for human risk assessment

Antony J. Williams <sup>a</sup>  $\stackrel{\square}{\sim}$   $\stackrel{\square}{\bowtie}$ , Jason C. Lambert <sup>a</sup>, Kris Thayer <sup>b</sup>, Jean-Lou C.M. Dorne <sup>c</sup>

# Recommended Reading





Volume 169, Issue 2 June 2019

# The Next Generation Blueprint of Computational Toxicology at the U.S. Environmental Protection Agency

Russell S Thomas 丞, Tina Bahadori, Timothy J Buckley, John Cowden, Chad Deisenroth, Kathie L Dionisio, Jeffrey B Frithsen, Christopher M Grulke, Maureen R Gwinn, Joshua A Harrill ... Show more

*Toxicological Sciences*, Volume 169, Issue 2, June 2019, Pages 317–332, https://doi.org/10.1093/toxsci/kfz058

## References

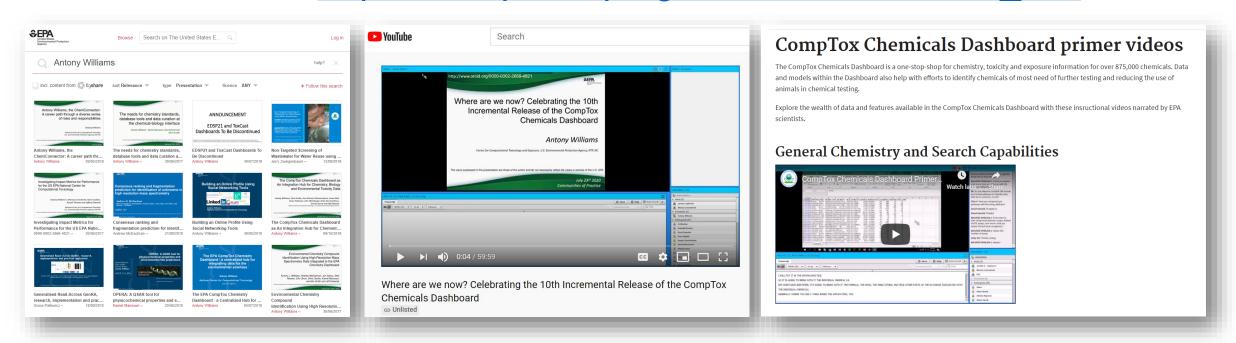


- The CompTox Chemistry Dashboard: a community data resource for environmental chemistry, J. Cheminformatics, 9, 61 (2017)
- EPA's DSSTox database: History of development of a curated chemistry resource supporting computational toxicology research, *Comp. Tox.* **12**, 100096 (2019)
- OPERA models for predicting physicochemical properties and environmental fate endpoints, *J. Cheminformatics*, **10**, 10 (2018)
- Screening Chemicals for Estrogen Receptor Bioactivity Using a Computational Model, Environ. Sci. Technol. 49, 8804-8814 (2015)
- ToxCast Chemical Landscape: Paving the Road to 21st Century Toxicology, Chem. Res. Toxicol. 29, 1225-51 (2016)
- Development and Validation of a Computational Model for Androgen Receptor Activity, Chem. Res. Toxicol. 30, 946-964 (2017)
- CERAPP: Collaborative Estrogen Receptor Activity Prediction Project, Environ. Health Perspect. 124, 1023 (2016)
- Abstract Sifter: a comprehensive front-end system to PubMed, *F1000*, **6**, 2164 (2017)

## You want to know more...



- Lots of resources available
  - Presentations: <a href="https://tinyurl.com/w5hqs55">https://tinyurl.com/w5hqs55</a>
  - Communities of Practice Videos: <a href="https://rb.gy/qsbno1">https://rb.gy/qsbno1</a>
  - Manual: <a href="https://rb.gy/4fgydc">https://rb.gy/4fgydc</a>
  - Latest News: <a href="https://comptox.epa.gov/dashboard/news">https://comptox.epa.gov/dashboard/news</a> info



# Acknowledgments



- Contact: Williams.Antony@epa.gov
- Feedback and follow-up is welcomed! Your questions help
- The dashboard is based on the efforts of many more team members than us. Many collaborators provide data also.



EPA's Center for Computational Toxicology and Exposure