

Data management solutions to support ENTACT and Non-targeted Analysis

<u>Christopher Grulke</u>¹

Hussein Al-Ghoul^{2,3} Jon Sobus³ Elin Ulrich³ Andrew D. McEachran^{1,2} Antony J. Williams¹ Ann M. Richard¹

NCCT, U.S. EPA ORISE Participant NERL, U.S. EPA



ENTACT, Summer 2018

15 August 2018, RTP, NC

The views expressed in this presentation are those of the author and do not necessarily reflect the views or policies of the U.S. EPA



Who am I?

- Name: Christopher M. Grulke
- Undergraduate Education:
 -BSE Chemical Engineering
- Job 1: Research Informatics at Pfizer
- Graduate Education
 - -PhD, Pharmaceutical Sciences
 - -Focus: QSAR modeling
- Current Position at EPA:
 - -Title: Computational Chemist
 - -Duties: Research (Chem)informatics so one
- Analytical Chemistry Background: 0
- Interest in Formal Presentation Formats: 0

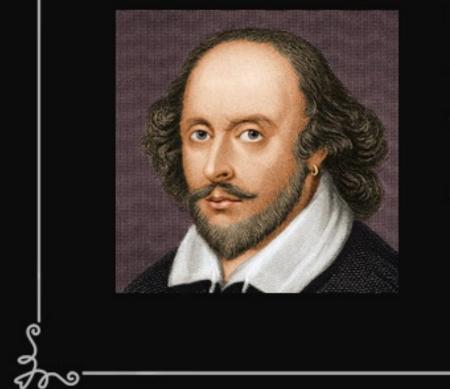






20





The evil that men do lives after them; the good is oft interred with their bones.

~ William Shakespeare

AZ QUOTES¹⁵⁹⁹ Antony. Julius Caesar, act 3, sc.2, I.74-86.

Office of Research and Development National Center for Computational Toxicology



Lets Start the "Evil"

- Evil Act I (completed 2 years ago)
 - -Yes, I designed the mixtures
 - -Yes, there were some mistakes in the mixtures
 - -Yes, I wanted to make them even more complicated
 - -Yes, you can blame me for everything

• Evil Act II (starting now)

- -Yes, I am going to talk about databases
- -Yes, It may get a bit boring
- -Yes, I will have all of the data
- -No, You can't take a nap
- Evil Act III (only if I can convince Elin and Jon)
 - -Yes, I want to make new mixtures to really cause problems



Goals for "Evil Mixtures"

Question(s):

- What is the relationship between NTA identification (methods) and chemical space detected?
- Are there chemicals that cannot be detected
- If mixtures are bigger, is detection frequency less?
- If I put the same chemical in a different mixture, can they find it?
- If I put the same chemical in a bigger mixture, can they find it?
- If I put the same chemical in a mixture with an isobaric chemical, can they find it?
- If I throw in some bad QC chemicals, can they find them?
- What if I toss an ill-defined chemical in the mixture?
- Hmmm, polymers are fun...
- Maybe I should vary concentration...



ToxCast Goals

Problem: Too many chemicals to test with standard animal-based methods

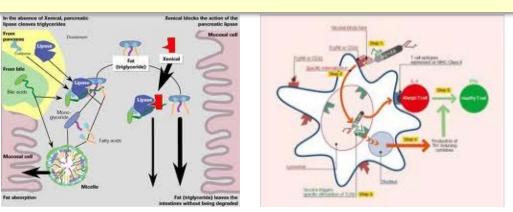
- Cost, time, animal welfare

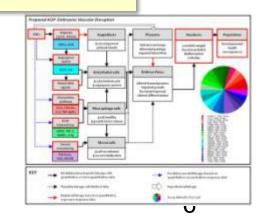
 Use high-throughput screening (HTS) assays to probe possible target & pathways linked to toxicity

- to day a we go - broth of some on boy to we 23 me

was assorting the of grand and and the star of man has the W of the auto and the

- Use large chemical library to probe molecular initiating events, modes of action, adverse outcome pathways
- Develop models to predict in vivo toxicity outcomes

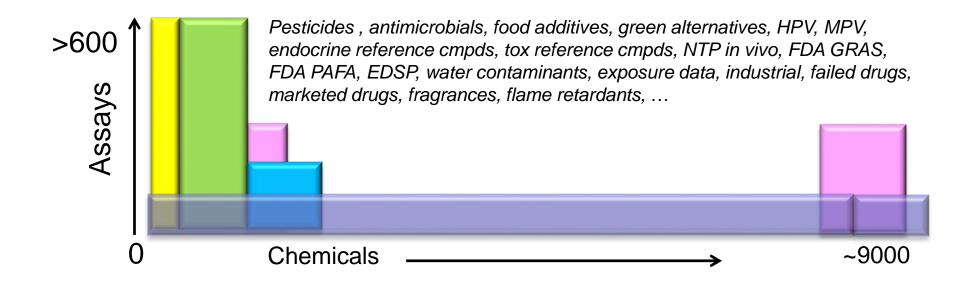


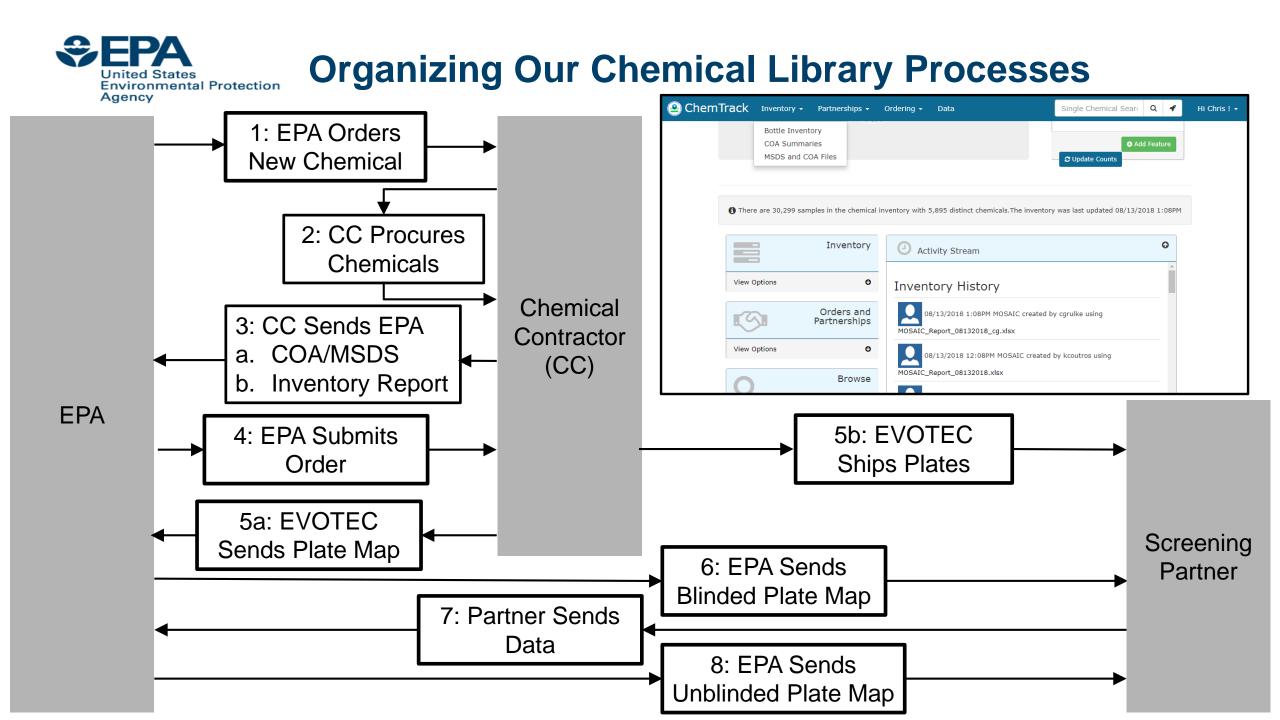




ToxCast & Tox21 Inventories: Chemicals, Data & Timelines

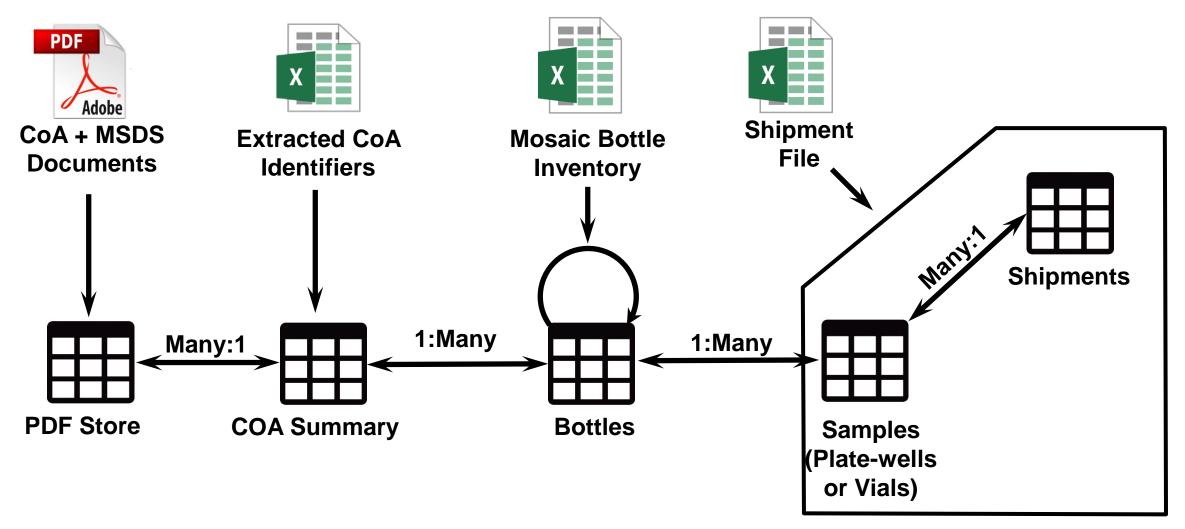
Set	Chemicals	Assays	Endpoints	Completion	Available
ToxCast Phase I	293	~600	~700	2011	Now
ToxCast Phase II	767	~600	~700	03/2013	Now
ToxCast E1K	800	~50	~120	03/2013	Now
Tox21	~9000	~80	~150	Ongoing	Ongoing
ToxCast Phase III	~900	~300	~300	Ongoing	Ongoing







ChemTrack Simple Data Model





ChemTrack Bottles

	ory • Partnerships • Ordering •	Data		Single Chemical Search		Q	4	Hi Chris !
Uploaded MOSAIC Files 25	Mapped & Available Bottles (29850)	Unmapped Bottles 449	External Bottles 98		Add New MOSAIC 🛓	Cre	ate Ex	ternal Bottle (

Mapped & Available Bottles

Show 10 v entries

Barcode Type 1 Barcode COA Summary Compound Name CAS QTY Available Units Vendor SAM J↑ CPD ↓↑ Can Plate?↓↑ Comment↓ Aluminium Sigma 14154-Edit 🖸 INVALID SUPTX0013222 INVALID ALID_SUPTX0013222_INVALID ≔ 2660 🔚 phthalocyanine 1000 mg Chemical SAM004888816 CPD003650672 Yes 42-8 Company chloride Sigma Nickle(III) carbonate 12607 INVALID_SUPTX0013294_INVALID ALID_SUPTX0013294_INVALID ₩ Edit 🖸 2735 🖽 250000 Chemical SAM004888887 CPD003650704 Yes mg basic hydrate 70-4 Company Sigma Edit 🖸 EPA_Vial_Source_Storage BF00079587 🔚 18768 🔚 Pentabromophenol 608719 178 mg Chemical SAM006061824 CPD001224527 Yes Company Sigma 85-44-Edit 🕼 BF00079581 🗮 18774 🖃 EPA_Vial_Source_Storage Phthalic anhydride 193 mg Chemical SAM006061820 CPD001252223 Yes 9 Company Sigma 7631-18772 🔚 Edit 🖸 EPA_Vial_Source_Storage BF00079583 🖽 TRIPOLI 196 Chemical SAM006061823 CPD001252283 Yes mg 86-9 Company Sigma 4,4'-Methylenebis(2-18773 🔚 Edit 🕼 EPA Vial Source Storage BF00079582 🔚 101144 188 mg Chemical SAM006061819 CPD001307314 Yes chloroaniline) Company Sigma 4-sec-Butyl-2,6-di-17540-Edit 🛙 EPA_Vial_Source_Storage BF00079585 🔚 18770 🖽 188 mg Chemical SAM006061825 CPD004560495 Yes tert-butylphenol 75-9 Company Sigma 8001-BF00079584 🔚 18771 🔚 Edit 🖸 EPA_Vial_Source_Storage Creosote 178 Chemical SAM006061821 CPD004757028 Yes mg 58-9 Company Sigma tert-Amyl methyl 994-Edit 🖸 EPA_Vial_Source_Storage BF00079586 🔚 18769 🔚 194 mg Chemical SAM006061822 CPD004757029 Yes ether 05-8 Company Sigma 3,3'-91-94-Edit 🖬 BE00079580 == 18775 == 188 Chemical SAM006061826 CDD004757030 Vec

ma

EDA Vial Source Storage Office of Research and Development

National Center for Computational Toxicology

Search:



ChemTrack Search

Find Chemicals 🗨 🤐 Chem		ntory 🗸 🛛 Partnerships 🗸	Ordering - Data				Single Chemical Sea	arch Q 🦿		
Info! Find by multiple bottles	Mult	iple Chemi	cal Search							
aspirin	Show 10	 entries 					Searc	h:		
bpa	Search	hed By 🕼 Found By 🐺	DTXSID 1 Name 1	CASRN 1	Neat(mg)	0-24mM Stock(ul)	24-100mM Stock(ul)	Number of Bottles		
50-00-0 tylenol tce	• tylenol	Synonym from Valid Source	DTXSID2020006 Acetaminophen	103-90-2	HIGH	HIGH	HIGH	15		
	💿 bpa	Expert Validated Synonym	DTXSID7020182 Bisphenol A	80-05-7	HIGH	HIGH	нідн	39		
	• tce	Expert Validated Synonym	DTXSID2021319 Tetrachloroethylene	127-18-4	NONE	NONE	NONE	3		
▼ Additional Filters	Barcode Supplier				Units	Concentration (mM) Solubility Solvent				
All Solution Neat	TX009583 LightBiologicals			-	mg ·					
	TX009584 LightBiological			-	mg ·	-				
Concentration Minimum	Tox21_201	196_legacy	-	-		-	-			
Minimum Amount Amount	50-00-	0 CAS-RN	DTXSID7020637 Formaldehyde	50-00-0	NONE	NONE	NONE	0		
	aspirin	Approved Name	DTXSID5020108 Aspirin	50-78-2	HIGH	HIGH	нідн	14		
	Barcode		Supplier		QTY U	Inits Concentration (mM) Solubi	lity Solvent		
	00891165		Enamine		- n	ng -	-			
	TX003515		Sigma Chemical Company		17831 u	I 20	DMSO			
	TX003516		Sigma Chemical Company		19 n	ng -	-			
Office of Research and Develop	TX016586		Sigma Chemical Company		2742 11	I 00	DMSO			



ChemTrack Shipments

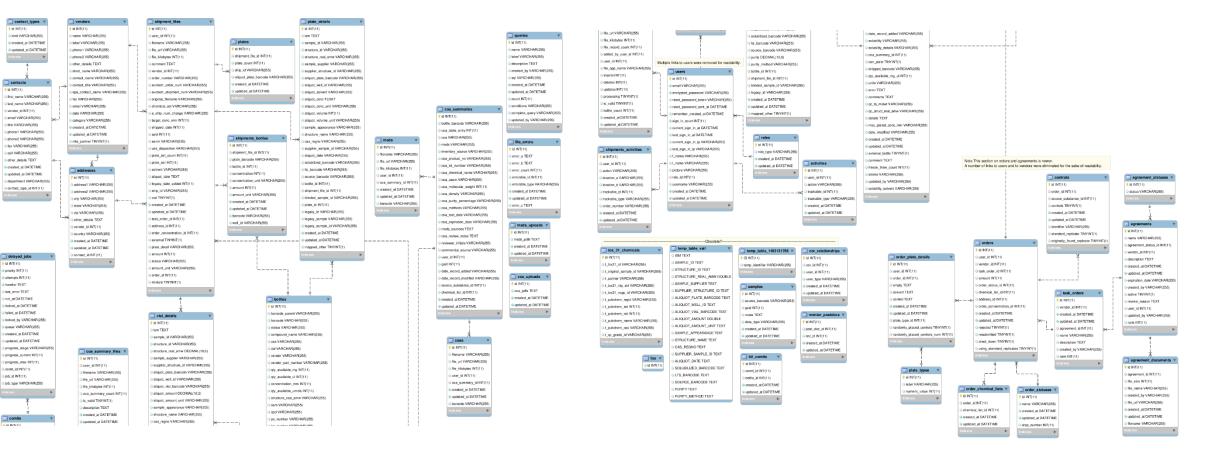
	ry - Partnerships	• Orderin	g v Data						Single Chemical	Search	Q	4
t Files External	Shipments	: K Inventor	y - Partnershi	ips 🔹 Ordering 🛨	Data				Uple	oad Shipment F Single Chem		/ Exter
Raw Shi Show 10 Created at J. 2018-08-06	· · · · · · · · · · · · · · · · · · ·		Peng Vi									
13:59 2018-07-31	-	File name		Size Comment	Vendor Name	Order ID	EPA Inter	nal Order ID	Evotec Order ID	Evotec Shi	pment ID	Shipped Date
15:05 2018-07-31 14:52		EPA_Mosaic147	753.csv 4030	03	UToronto-Peng		298		14753	11292		20180806
2018-07-31 13:04		Ge Back to ind	ex page 🥒 Up	odate								
2018-07-31 10:30	E											
2018-05-18 14:28	B										Export XI	S Plate Map
2018-05-18 13:14	1	Vial Details	entries								Search:	
2018-05-11 16:47			Vial_Barcode	ISM	Blinded Sample II) † Sample	ID It	Structure ID	Amount(mg) 1	CAS_REGNO ↓↑	Supplier_Sa	mple_ID\(Mor
2018-05-11 16:40	-	0194733407	1502666	OC(=0)C(F)(F)C(F) (F)C(F)(F)F	1502666	SAM0070		CPD004576314	100.0	375-22-4		Sho
2018-05-11 16:36	8	1141925960	1502704	OCC(F)(F)C(F) (F)C(F)(F)C(F) (F)C(F)(F)C(F) (F)C(F)(F)C(F)	1502704	SAM0070	001851	CPD007000659	100.0	423-65-4		Sho

National Center for Computational Toxicology



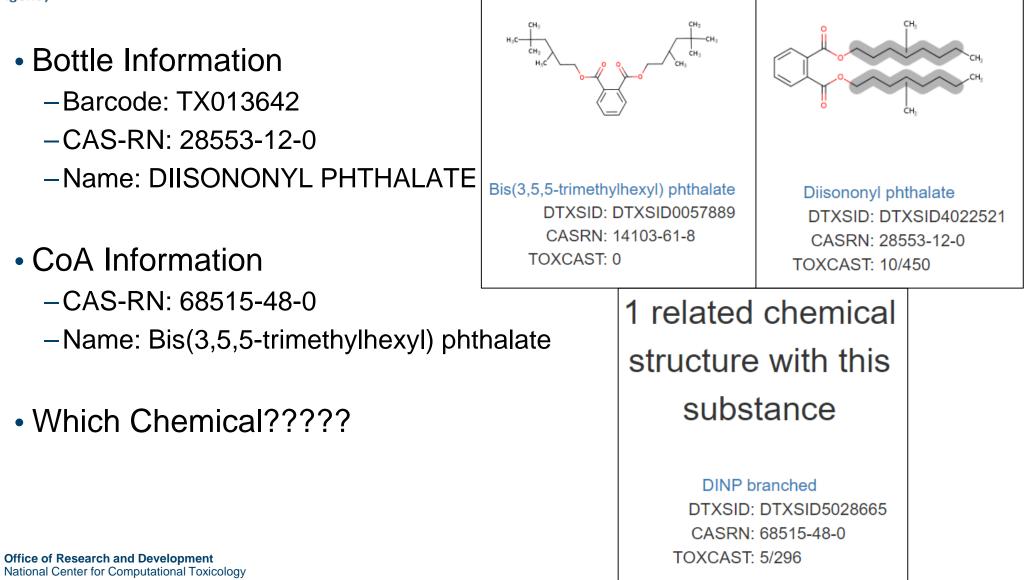
ChemTrack Schema

57 Tables





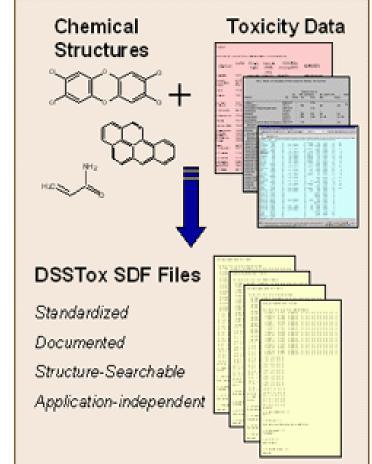
Bottles and Samples Need Chemistry





DSSTox Ancient History

- Goal: Linking chemical structures to data enabling SAR
- First release of data files in 2004
- Focused on high impact sets of data
 - -Carcinogenic Potency Database
 - -Drinking water disinfection by-products
 - -EPA's Integrated Risk Information System
 - -FDA's Maximum Daily Dose dataset
 - -EPA's Fat Head Minnow Toxicity dataset
 - -etc...
- Managed all chemical registration for ToxCast and Tox21 chemicals
- By 2014, roughly 20K manually curated substance records



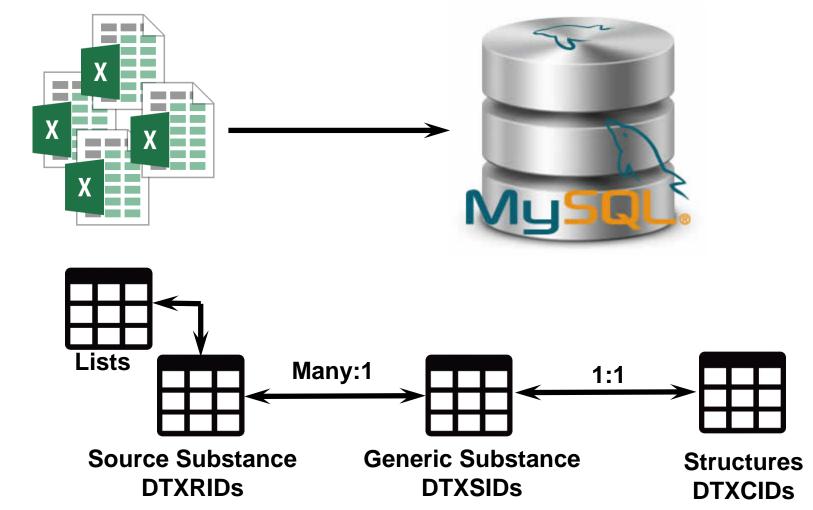


DSSTox Current History

- 762K substance records (28.5K manually curated)
- Central database for the Comptox Chemical Dashboard
- More Goals:
 - -Become a hub for all chemical data relevant to an environmental scientist
 - -Provide batch extraction of chemical data for our user community
 - -Offer chemical list based views of our data
 - -Provide list specific search capabilities
- Check out: https://comptox.epa.gov/dashboard

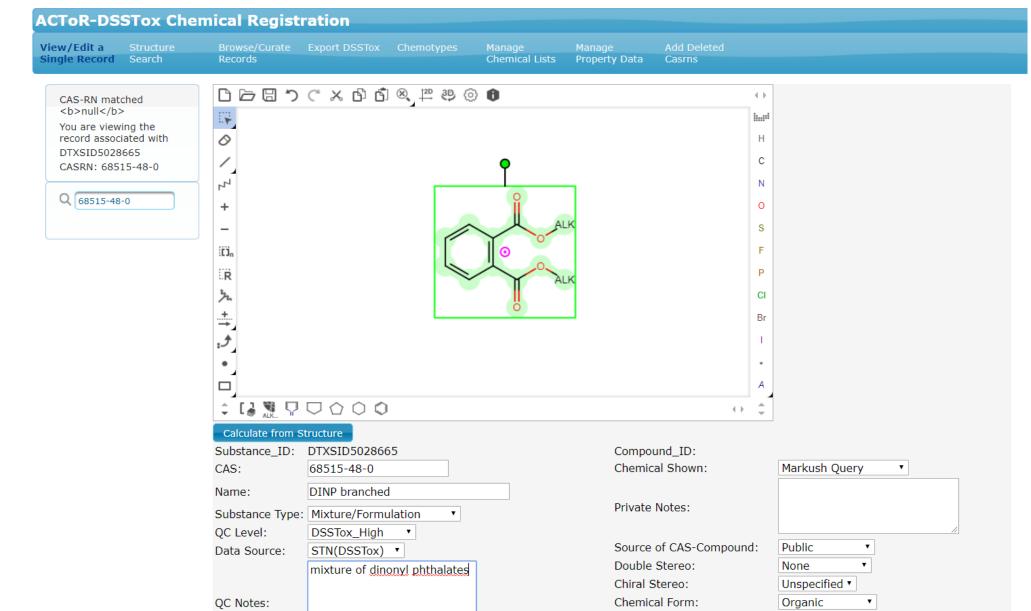


Generalized DSSTox Storage Architecture





Chemical Registration



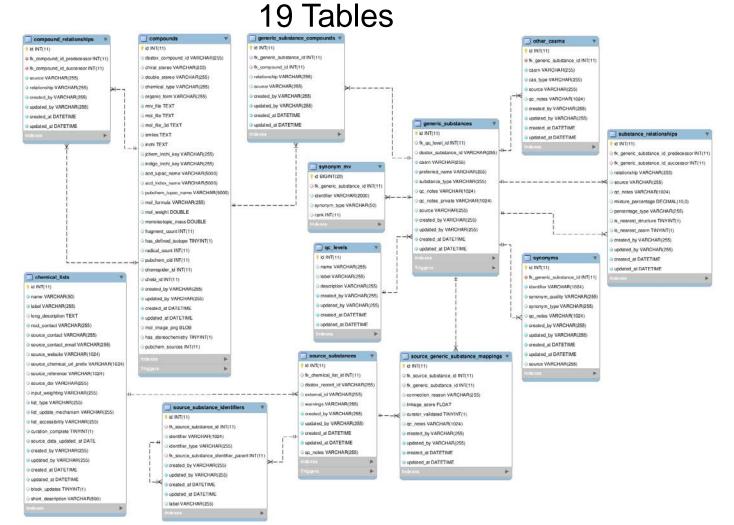


Chemical List Registration

			Hit	S				
	ssCAS-RN	ssName	Hit Desc	Hit S	ubstance_ID	Hit Casrn	Hit Name	
•		Norgestrel	Structure matched SMILES	DTXSID1085	<u>9541</u> N	OCAS_859541	13-Ethyl-17-ethynyl-17-hyd 1,2,6,7,8,9,10,11,12,13,14, tetradecahydro-3H- cyclopenta[a]phenanthren-3 (non-preferred name)	,15,16,1
•		Norgestrel	Mapped Identifier matched NAME1	DTXSID3036	496 7	97-63-7	Levonorgestrel	
•		Norgestrel	Mapped Identifier matched NAME1	DTXSID3047	477 6	533-00-2	dl-Norgestrel	
			Map hit	Cancel				
SMILES Valid Sync matched I Preferred matched I Valid Sync matched o record: N. Unique Sy matched o record: N. Unique Sy matched o Mapped Io matched I Name2Str Export Al	AMME2 Name VAME1 VAME1 VAME1 VAME1 VAME1 + nonym other AME2 nonym other AME2 III R AME2 III R AME2 III R AME2 III Calculate from Struc Substance_ID: DT. CAS: 79	ture XSID3036496 7-63-7 vonorgestrel	tte H C H C H C C H H C S F P C C H H Br I A A A A C Compound_ID: Chemical Shown: Private Notes: 8.7.0.	Ier → → → ↓ + + - □ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓	ucture	H ₃ C HO H C HO H H C C H H H C C H C C M POUR Chemica		N
	QC Level: DS	SSTox_High	Source of CAS-Compound:	SIDE Substance Type:	Mixture of Stereoisomers DSSTox_High	Private N	otes: Hits	



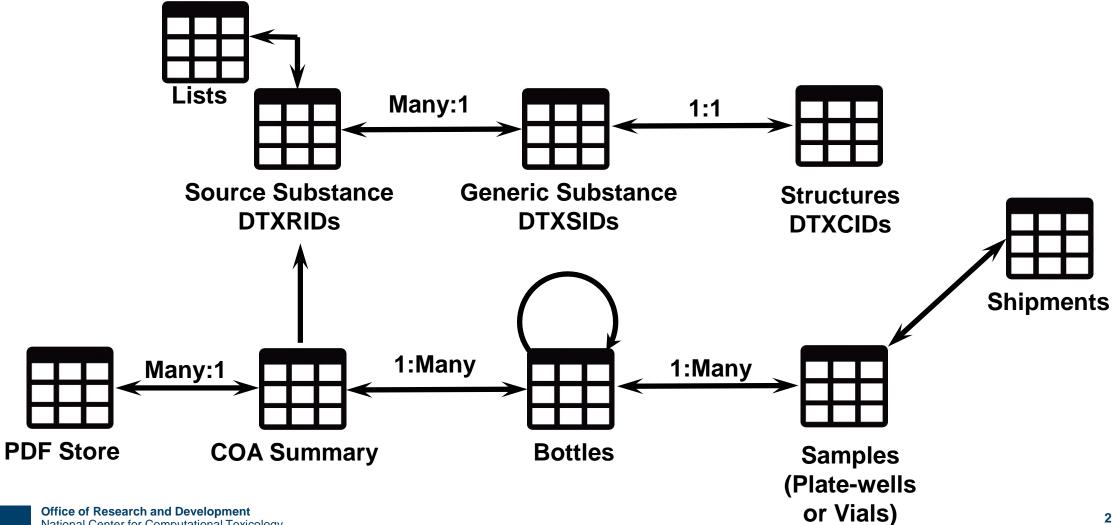
DSSTox Chemistry Schema



Office of Research and Development National Center for Computational Toxicology



Link ChemTrack CoA Summaries to DSSTox





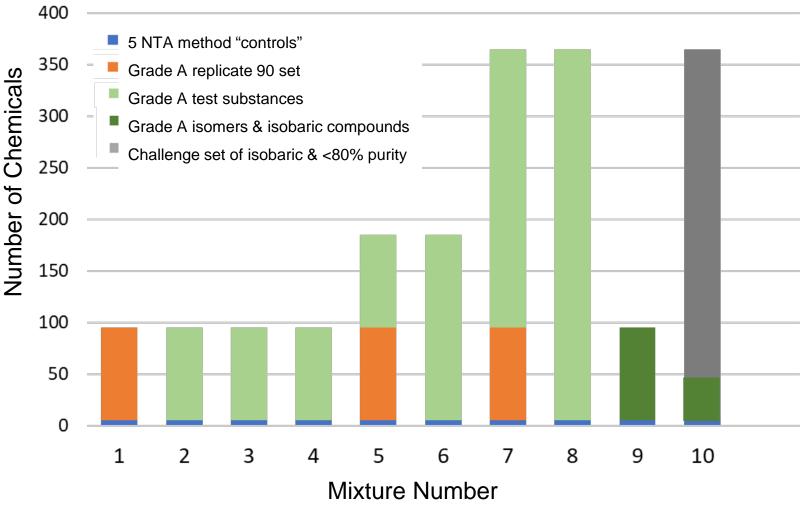
Wait, weren't we making mixtures... "EVIL MIXTURES"

Question(s):

- What is the relationship between NTA identification (methods) and chemical space detected?
- Are there chemicals that cannot be detected
- If mixtures are bigger, is detection frequency less?
- If I put the same chemical in a different mixture, can they find it?
- If I put the same chemical in a bigger mixture, can they find it?
- If I put the same chemical in a mixture with an isobaric chemical, can they find it?
- If I throw in some bad QC chemicals, can they find them?
- What if I toss an ill-defined chemical in the mixture?
- Hmmm, polymers are fun...
- Maybe I should vary concentration...



General Mixture Plan...



<u>10 Prepared Mixtures</u>:1,939 total spiked substances1,269 unique substances:

- $1 \rightarrow$ spiked 11 times
- 4 \rightarrow spiked 10 times
- 57 \rightarrow spiked 4 times
- $33 \rightarrow$ spiked 3 times
- 388 \rightarrow spiked 2 times
- 786 \rightarrow spiked 1 time



Limiting My "Evil"



Comments from Confluence Page on Mixture Creation September 2015

- Jon Sobus: How loose do you want to get with respect to QC levels for the "messy mixtures"? I'm a little worried that a messy mixture with 384 might be too difficult.
- Chris Grulke: I think it might be difficult, but not more difficult than dealing with a real media sample.... Muhuhahahahaha!



"Easy" Mixtures

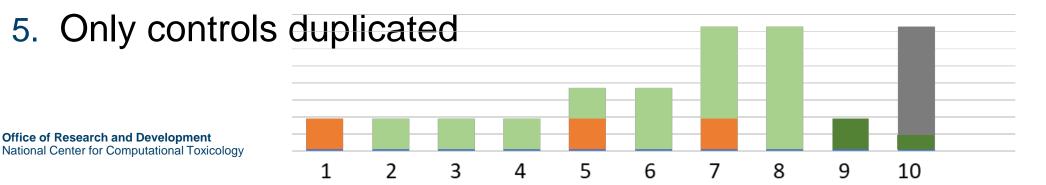
General Easy Mixtures (2,3,4,6,8)

- 1. Sample available in the ToxCast Library
- 2. Samples Passed Analytical QC
- No isobaric conflicts (based on 5 ppm resolution)
- 4. Span the logP and monoisotopic mass range

Embedded Set Mixtures (1,5,7)

- 1. Obey rule 1-4 of General Easy Mixtures
- 2. Mixtures of 95,185,365 all embedding a common 95 chemicals

25





Selecting the "Control" Chemicals - Mixture Pilot Successes

- 947 chemicals identifier in dust
- 100 selected and placed in a blinded mixture
- 58 were identified when performing NTA on the mixture
- Jon picked 13
- I picked 5

Rank priority	CAS	DSSTox_name	LC_and_G C	QC_Score	LC_mode	Both concentrations
1	1085-12-7	Heptylparaben	yes	A	neg and pos	yes
2	120-32-1	Clorophene	yes	A	neg and pos	yes
<mark>3</mark>	<mark>13674-87-8</mark>	TDCPP	yes	A	neg and pos	yes
<mark></mark>	<mark>84-61-7</mark>	Dicyclohexyl phthalate	yes	A	neg and pos	yes
<mark>5</mark>	<mark>94-13-3</mark>	Propylparaben	yes	<mark>A</mark>	neg	yes
6	105-99-7	Dibutyl hexanedioate	yes	A	pos	yes
7	63-05-8	4-Androstene-3,17-dione	yes	А	pos	yes
<mark>8</mark>	<mark>63-25-2</mark>	Carbaryl	yes	A	pos	yes
9	77-93-0	Triethyl citrate	yes	А	pos	yes
10	78-42-2	Tris(2-ethylhexyl) phosphate	yes	A	pos	yes
<mark>11</mark>	<mark>84-66-2</mark>	Diethyl phthalate	yes	A	pos	yes
12	125-33-7	Primidone	yes	A	neg and pos	yes
13	4559-86-8	1,1,3,3-Tetrabutylurea	yes	А	pos	yes



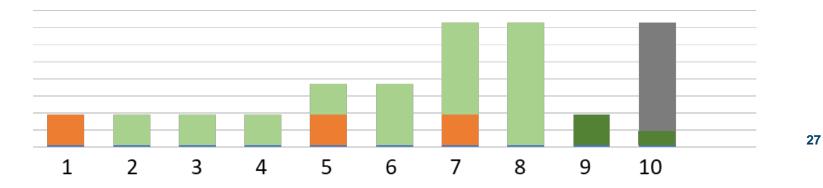
Making Hard Mixtures

Isobar Mixture (9)

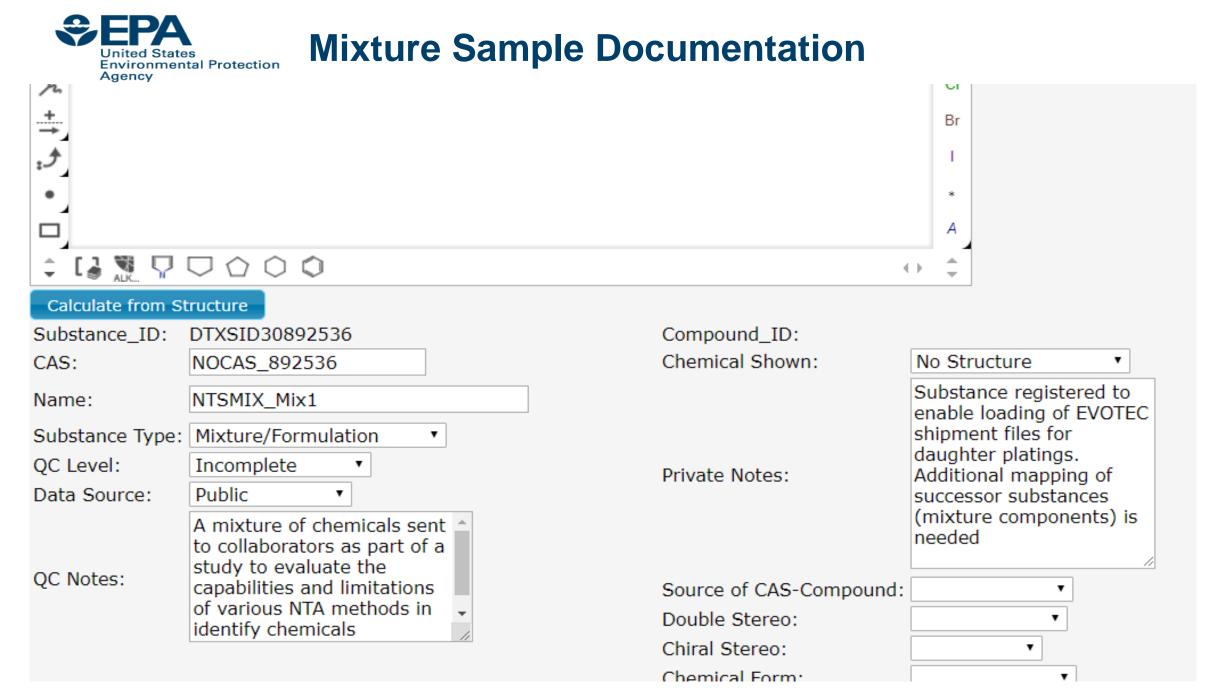
- 1. Sample available in the ToxCast Library
- 2. Samples Passed Analytical QC
- All isobaric conflicts (based on 5 ppm resolution) with conflicted chemicals run individually in Easy Mixtures

Isobar and QC Fail Mixture (10)

- 1. Dump in the rest of the isobars from the library
- 2. Add some things which we detected during QC, but with concentration issues.



Office of Research and Development National Center for Computational Toxicology





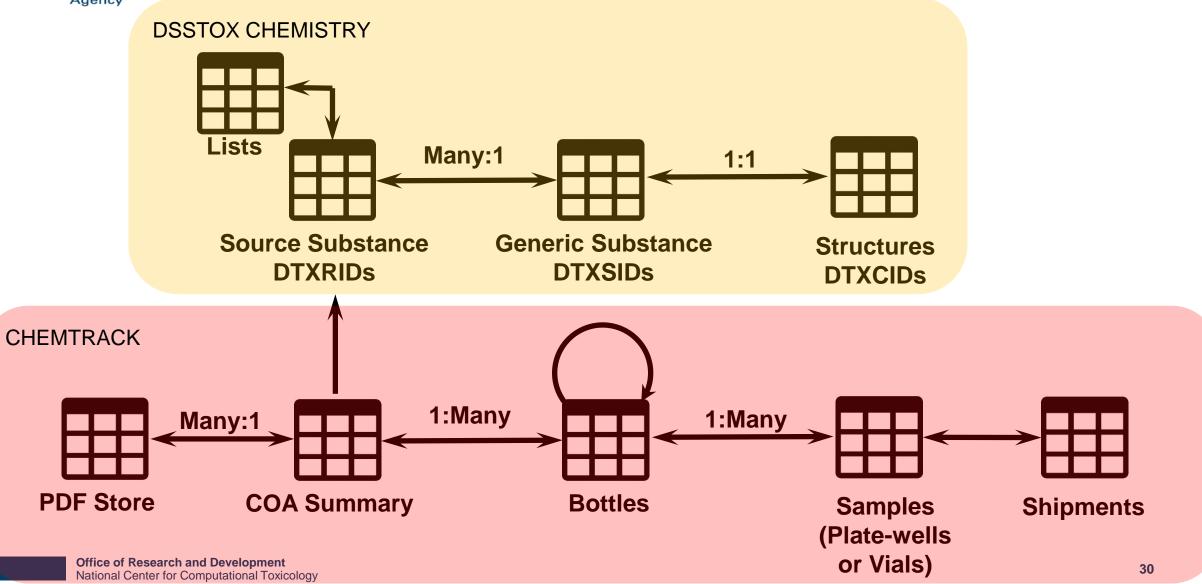
Lets Start the "Evil"

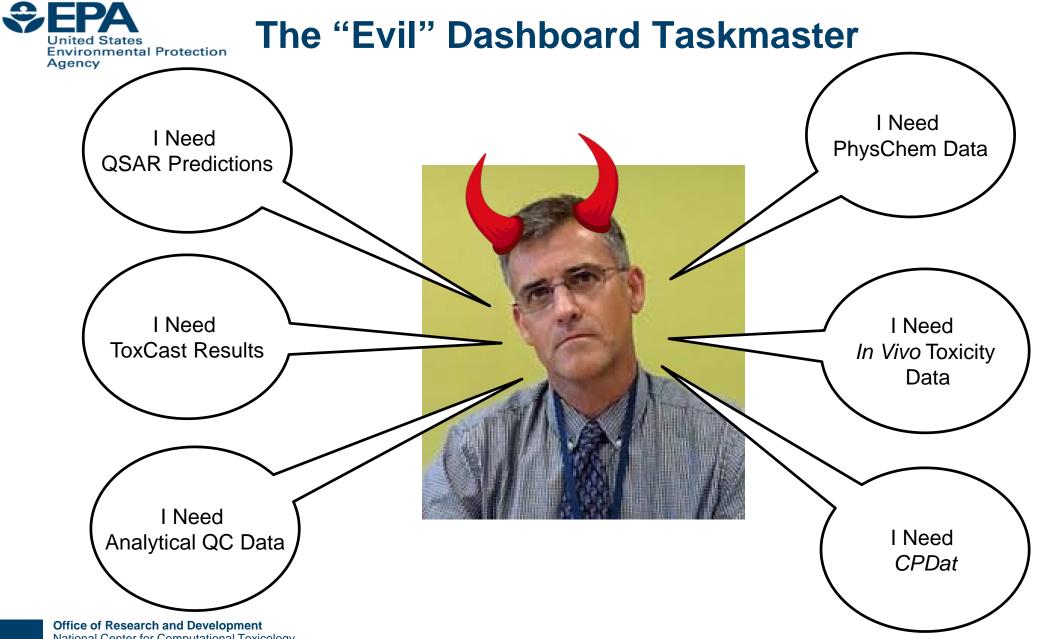
- Evil Act I (completed 2 years ago)
 - -Yes, I designed the mixtures
 - -Yes, there were some mistakes in the mixtures
 - -Yes, I wanted to make them even more complicated
 - -Yes, you can blame me for everything

• Evil Act II (starting now)

- -Yes, I am going to talk about databases
- -Yes, It may get a bit boring
- -Yes, I will have all of the data
- -No, You can't take a nap
- Evil Act III (only if I can convince Elin and Jon)
 - -Yes, I want to make new mixtures to really cause problems



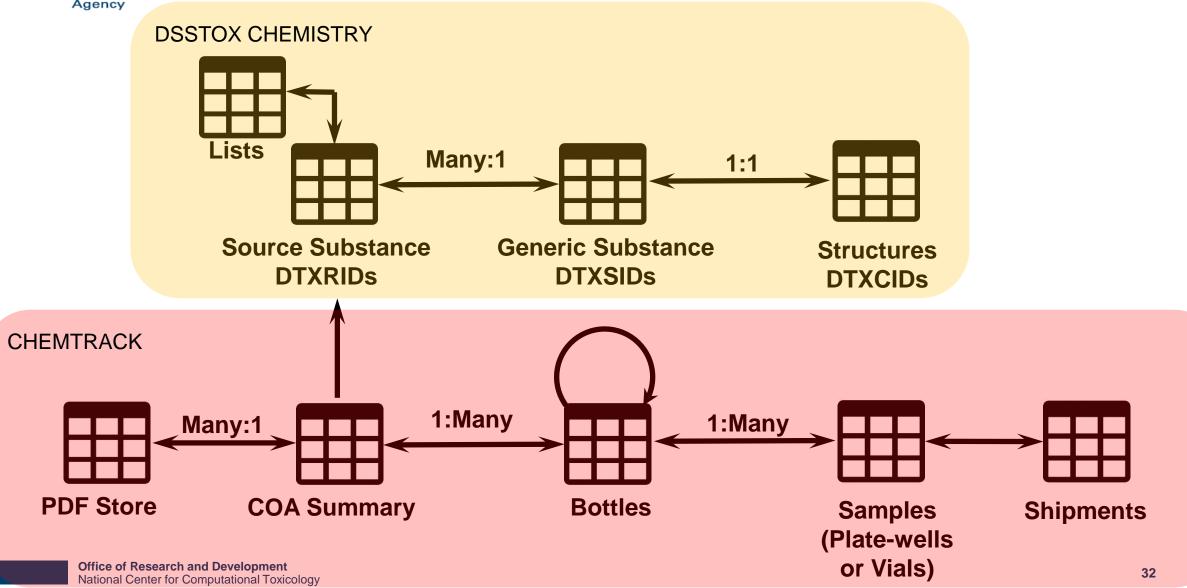


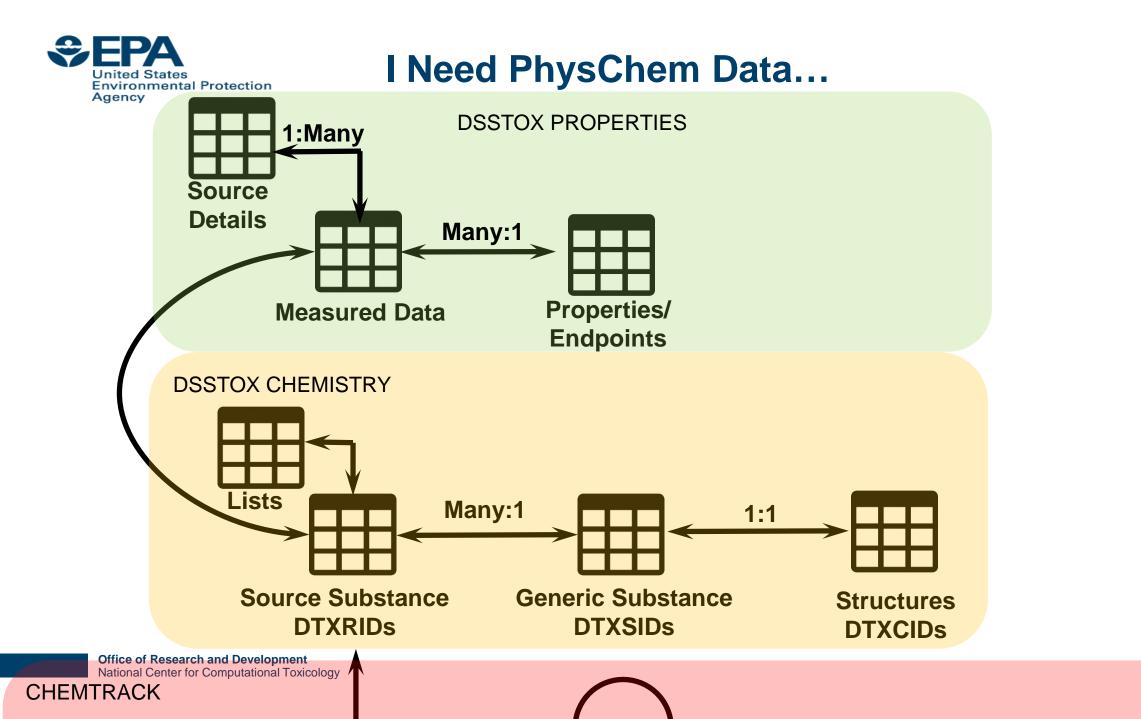


National Center for Computational Toxicology

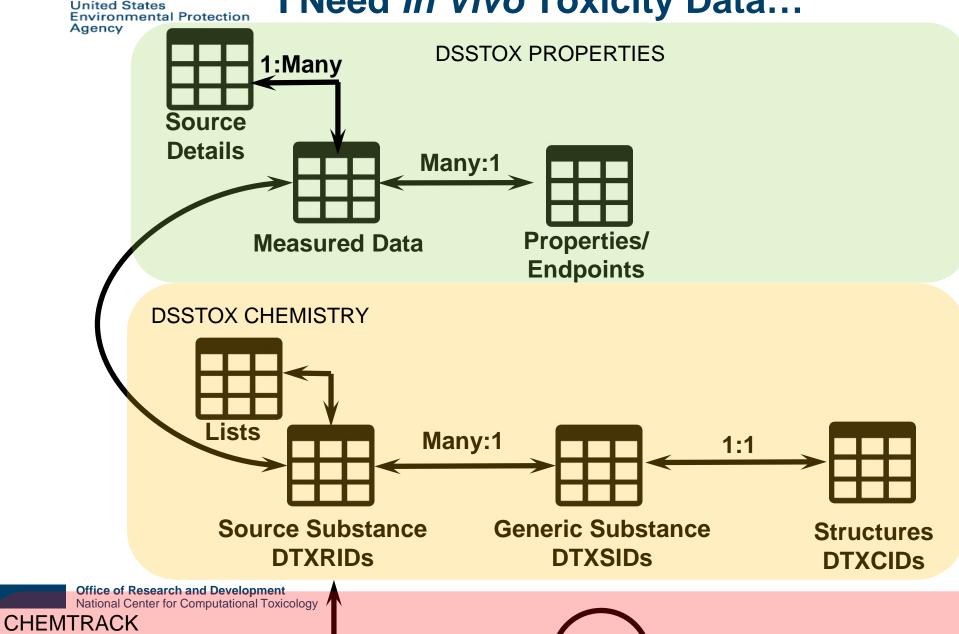


I Need PhysChem Data...





I Need In Vivo Toxicity Data...

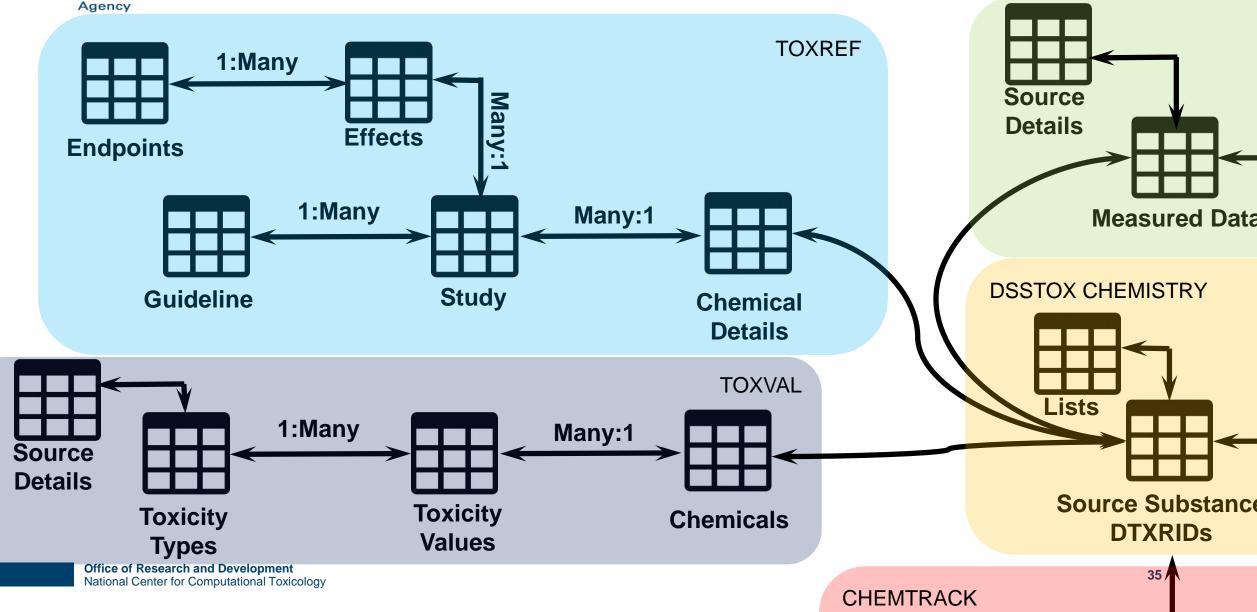


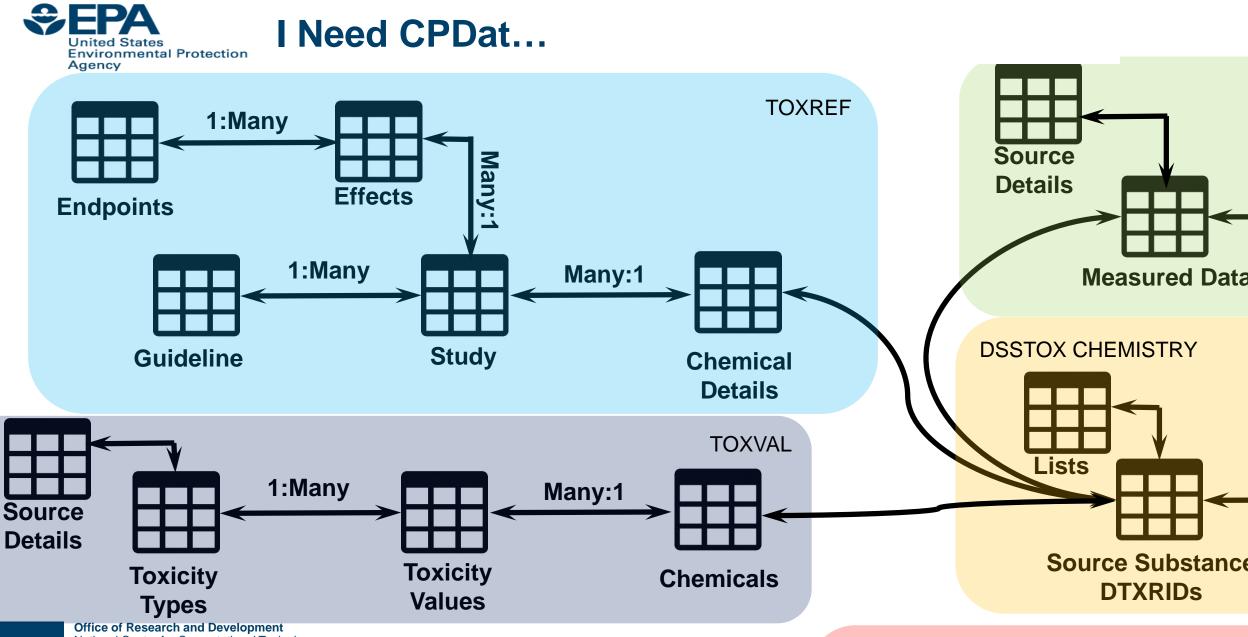
I Need In Vivo Toxicity Data...

€FPA

United States

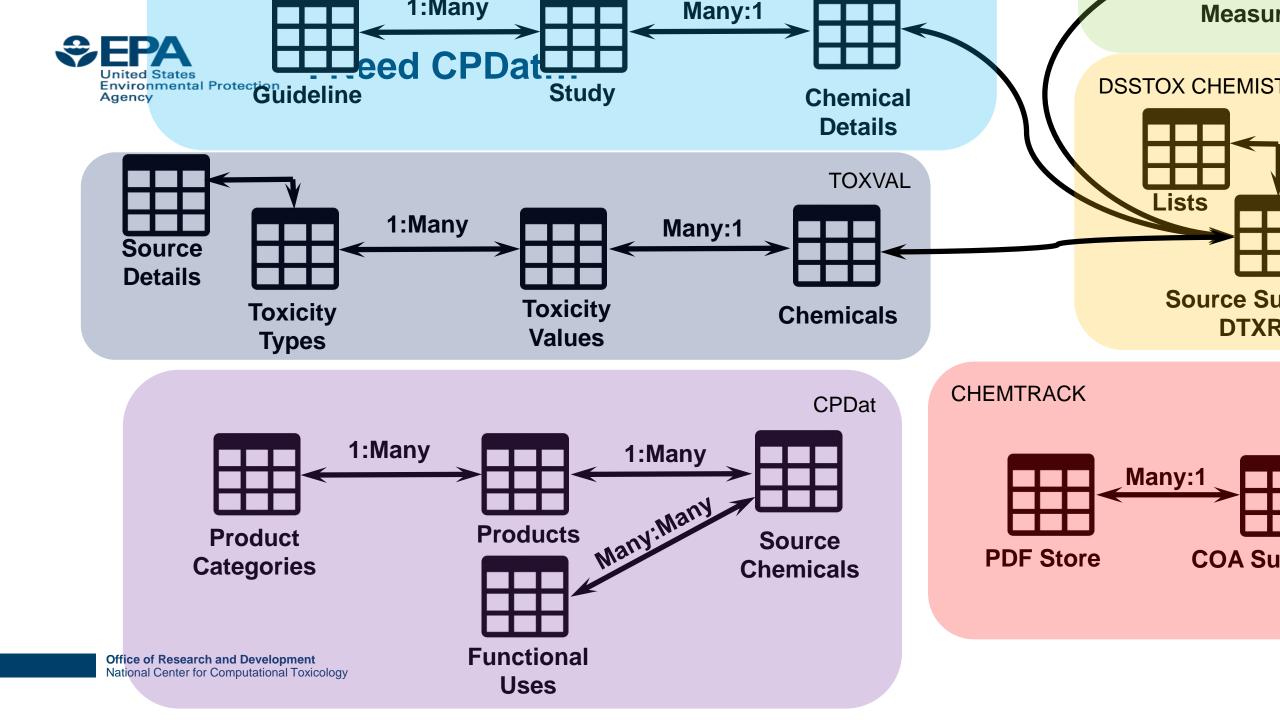
Environmental Protection

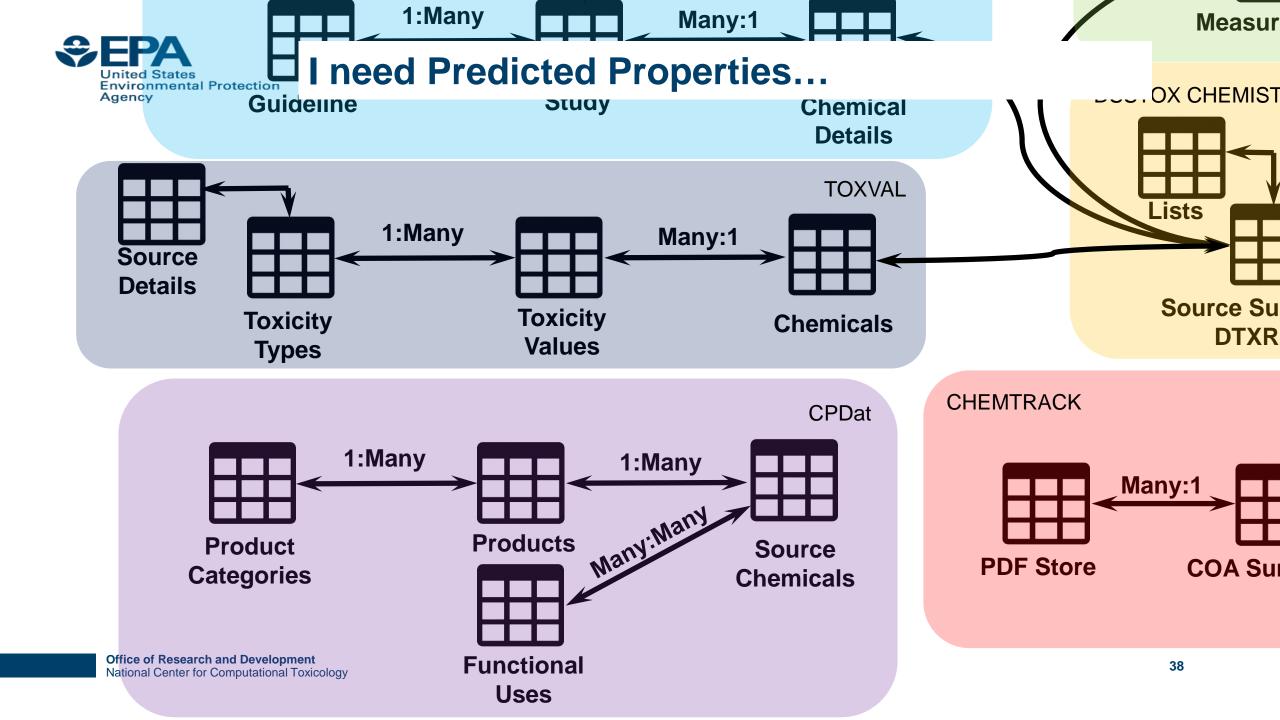




National Center for Computational Toxicology

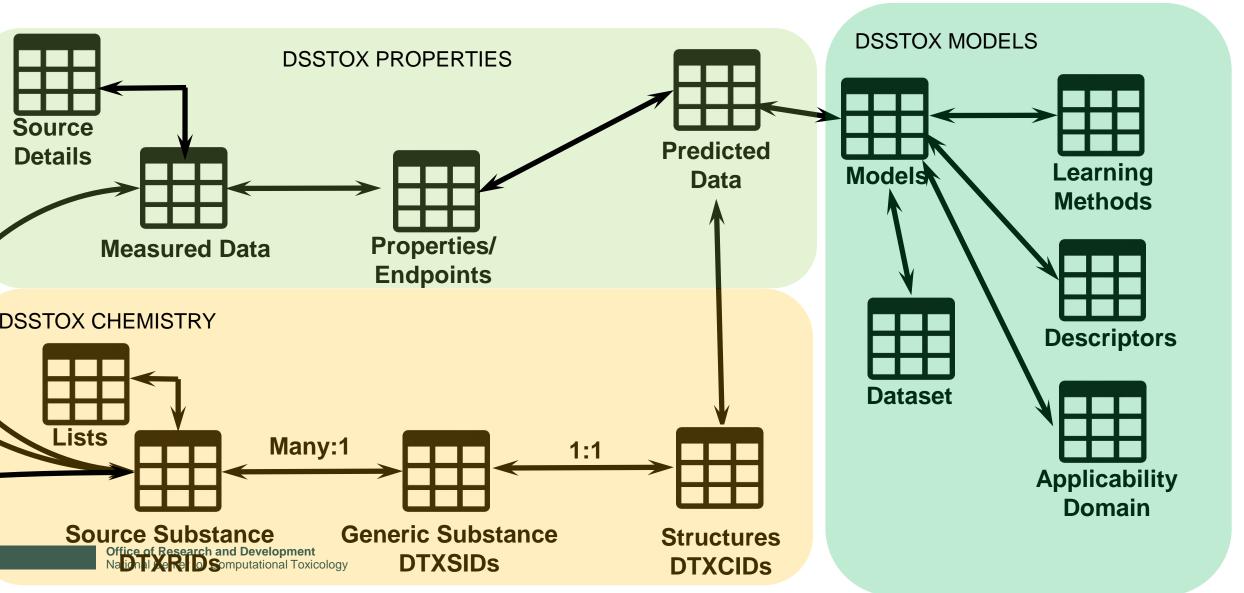
CHEMTRACK





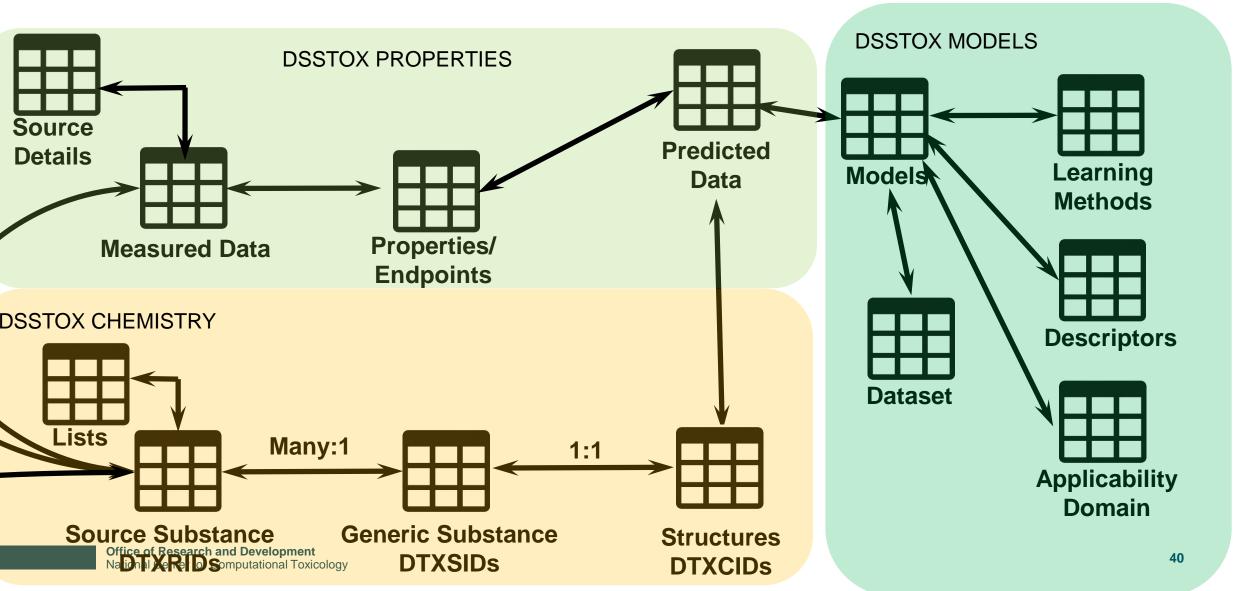


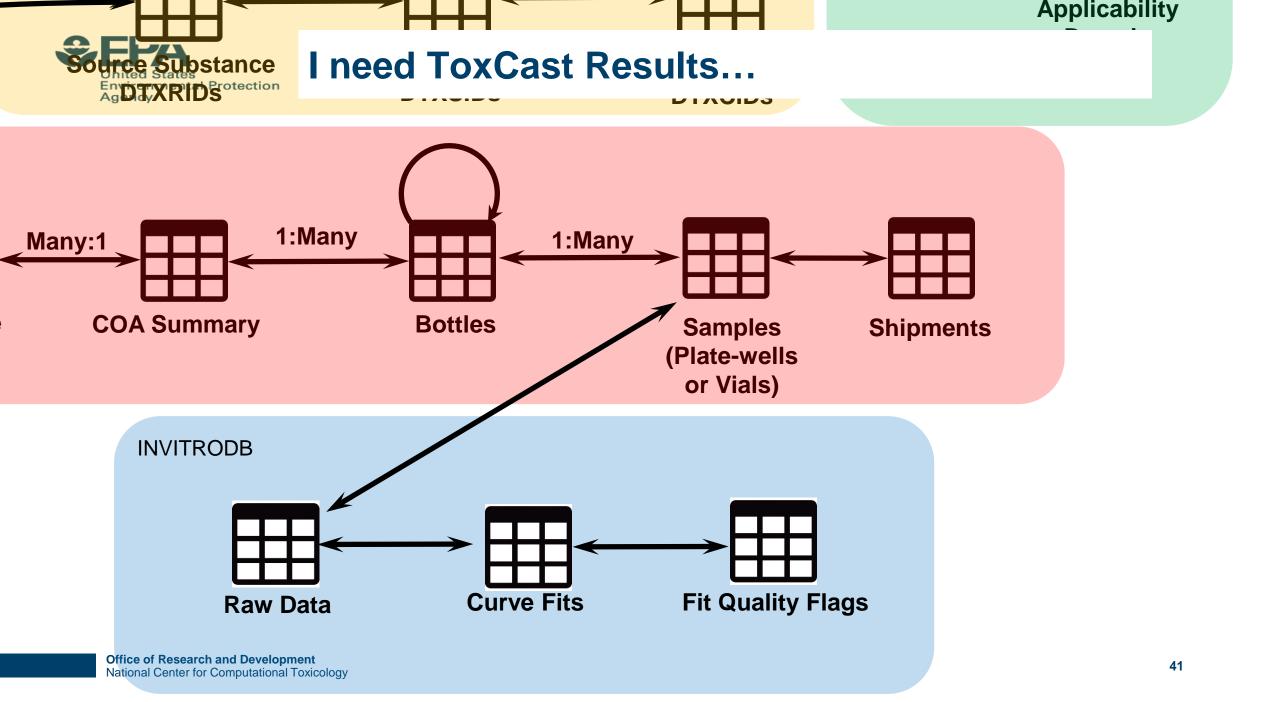
I need Predicted Properties...

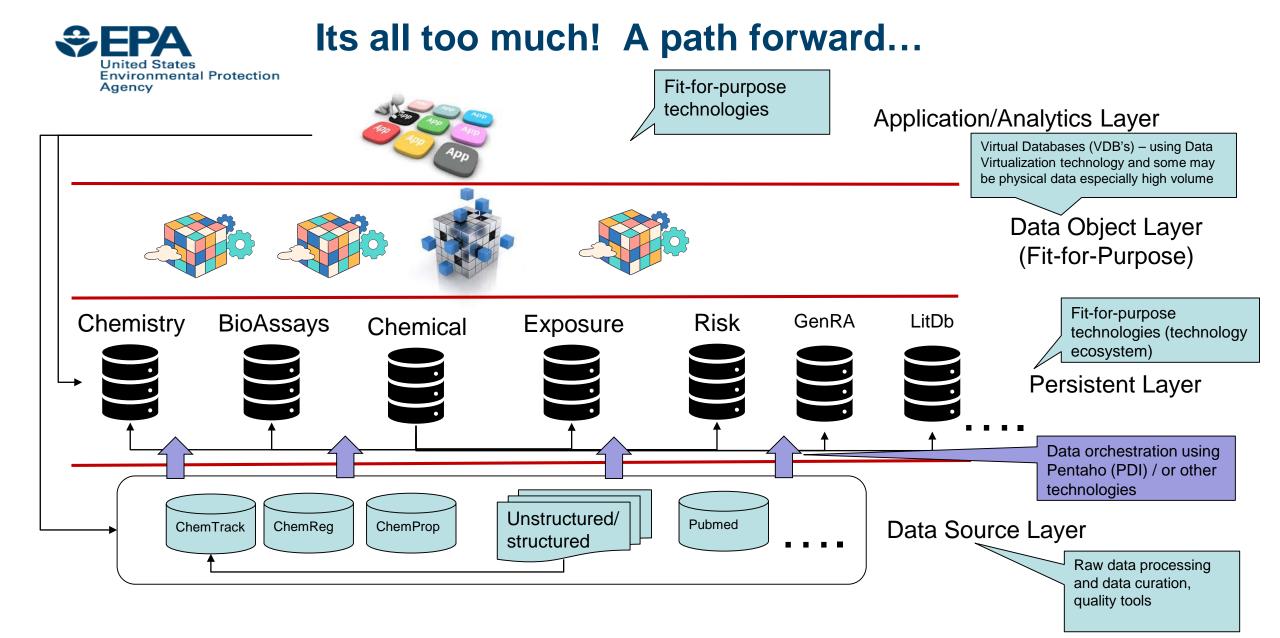




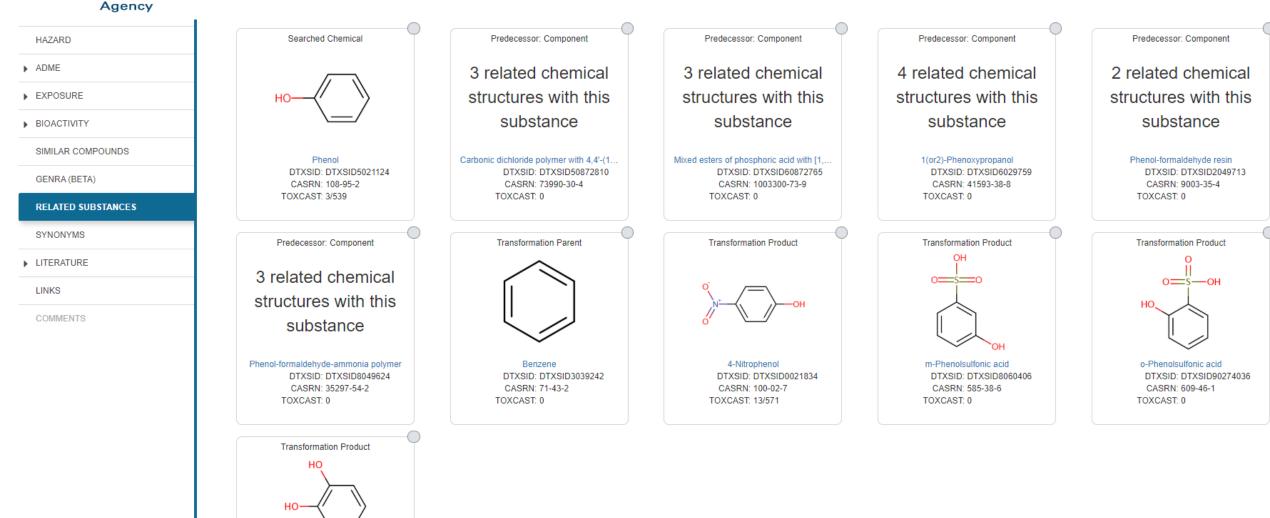
I need ToxCast Results...







Supporting Chemical Relationships



United States

Environmental Protection



44

UVCB Chemicals



This paper is a compendium of information related to the broad class of chemical substances referred to as UVCBs for the Toxic Substances Control Act (TSCA) Chemical Substance Inventory. These chemical substances cannot be represented by unique structures and molecular formulas.

- UVCB chemical examples
 - -Surfactants with undefined composition
 - -Petroleum Distillates
 - -Gelatins, hydrozylates
 - -Formaldehyde, reaction products with diethanolamine
 - -Fatty acids, linseed-oil, compds. with triethylamine



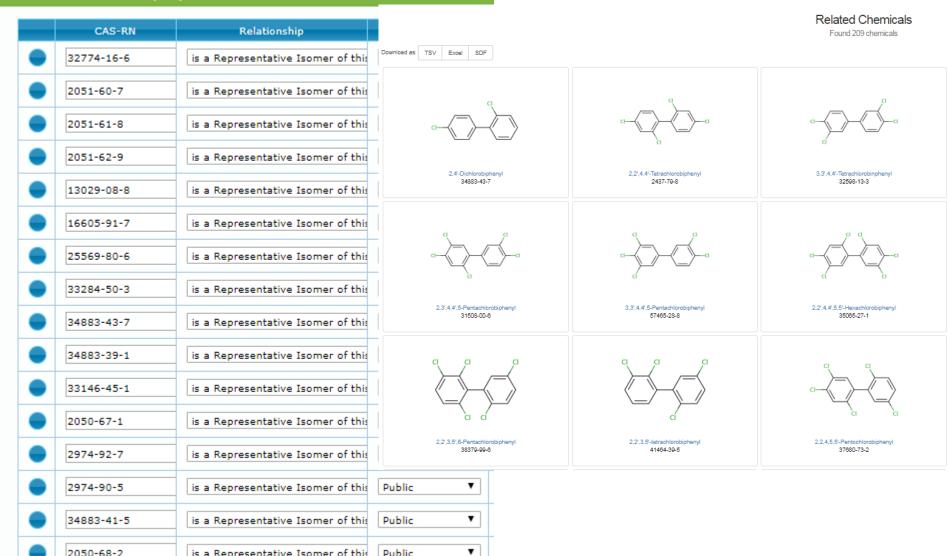
Chemical Families (e.g. PCBs)

Successor Substances (209)

2050-68-2

is a Representative Isomer of this

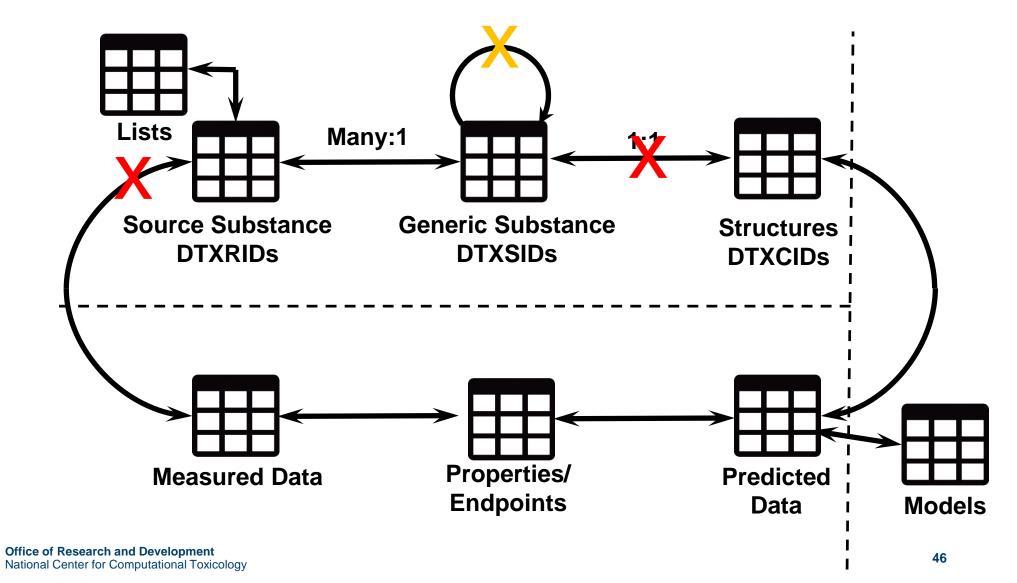
Public



Of Na



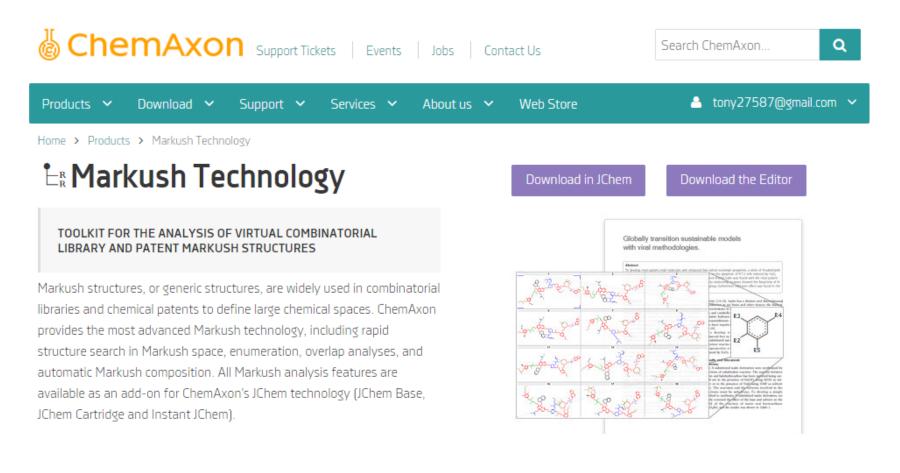
Data linkage breakdown





47

ChemAxon Markush Technology

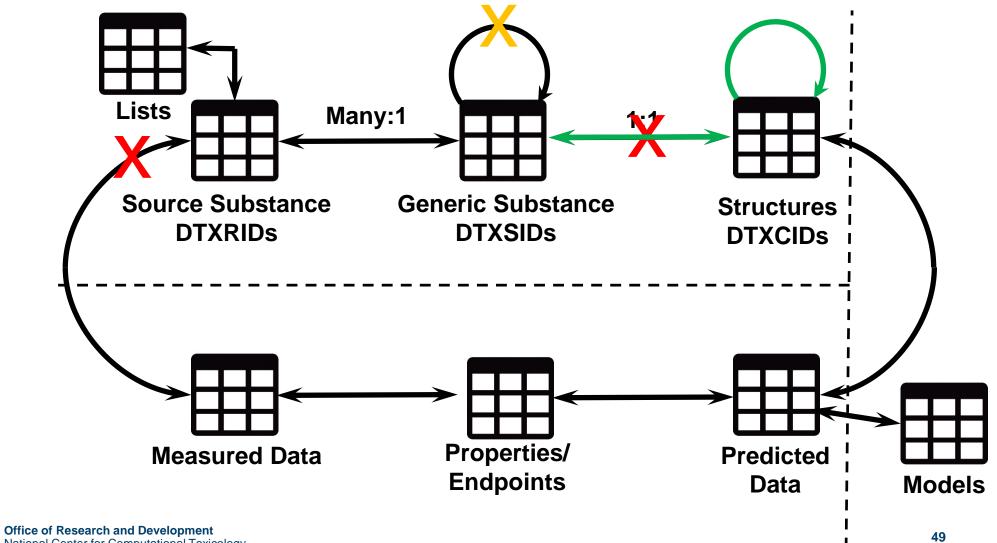




Update Record

₲₡₽₽₡₢₲₭ﻯ₵₿₫		•
F		had
0		н
/		с
L1		N
+		0
- H.C.	ОН	S
		F
.R L J	3-10	Р
×.		сі
た <u>キ</u> チ		Br
÷		1
•		*
		A
	٠	*
Calculate from Structure		
ubstance_ID: DTXSID4028331	Compound_ID: Chemical Shown:	Markush Enumerable
AS: 67762-41-8	Chemical Shown:	
ame: C10-16 Alcohols		
ubstance Type: Mixture/Formulation	Private Notes:	
C Level: DSSTox_High V		
ata Source: STN(DSSTox) 🔻	Source of CAS-Compou	und: Public 🔻
SDA (Soap and Detergent	Double Stereo:	None 🔻
Association) Reporting Number: 15-060-00. SDA Substance	Chiral Stereo:	None 🔻
C Notes: Name: C10-C16 alkyl alcohol	Chemical Form:	Organic 🔹
	Organic Form: Parent	





National Center for Computational Toxicology

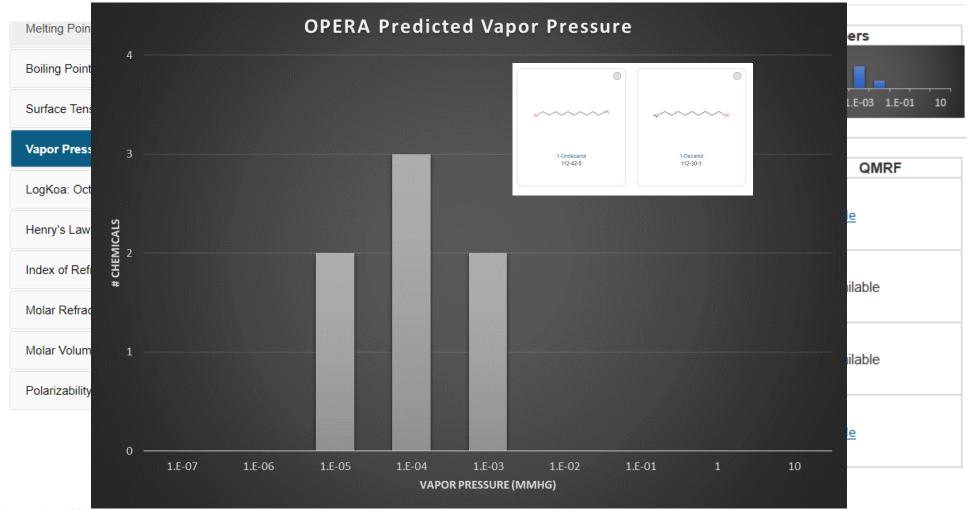


Collecting Property Distributions for Markush Members

Melting Point			Experimental
Boiling Point	Source	Result	
Surface Tension	PhysPropNCCT	2.52e-05 mmHg	
Vapor Pressure			Predicted
LogKoa: Octanol-Air	Source	Result	Calcu
Henry's Law	NICEATM	5.23e-05 mmHg	Not Available
Index of Refraction	ACD/Labs	1.24e-04 mmHg	Not Available
Malas Dafasativita	TEST	1.24e-05 mmHg	TEST Report
Molar Refractivity OPERA	OPERA	1.33e-05 mmHg	OPERA Model Report
Molar Volume			
Polarizability			



Collecting Property Distributions for Markush Members



Office of Research and Development National Center for Computational Toxicology



- There is a lot of data
- We want to connect it all
- Please, share your priorities through the Comptox Dashboard! <u>https://comptox.epa.gov/dashboard</u>



- Evil Act I (completed 2 years ago)
 - -Yes, I designed the mixtures
 - -Yes, there were some mistakes in the mixtures
 - -Yes, I wanted to make them even more complicated
 - -Yes, you can blame me for everything
- Evil Act II (continuing)
 - -Yes, I am going to talk about databases
 - -Yes, we want all your data
 - -Yes, you are going to probably want to take a nap
- Evil Act III (only if I can convince Elin and Jon)
 - -Yes, I want to make new mixtures to really cause problems



Acknowledgements



<u>EPA NCCT IT</u> Jeff Edwards Jeremy Dunne Amar Singh

<u>EPA NCCT Registration</u> David McKee Inthirany Thillainadarajah Sakuntala Sivasupramaniam

EPA NCCT Tox* Databases Sean Watford Katie Paul-Friedman Richard Judson Duncan McPherson EPA NERL CPDat Kathie Dionisio Katherine Phillips Kristin Isaacs Brian Meyer

EPA NCCT ChemTrack Chris Higgins Jon Gardner Kathy Coutros



Questions?