

*Vanderbilt Institute of Chemical Biology Seminar - March 28, 2007:*

# *Expanding Chemical-Toxicity Information Resources in Support of Predictive Toxicology*

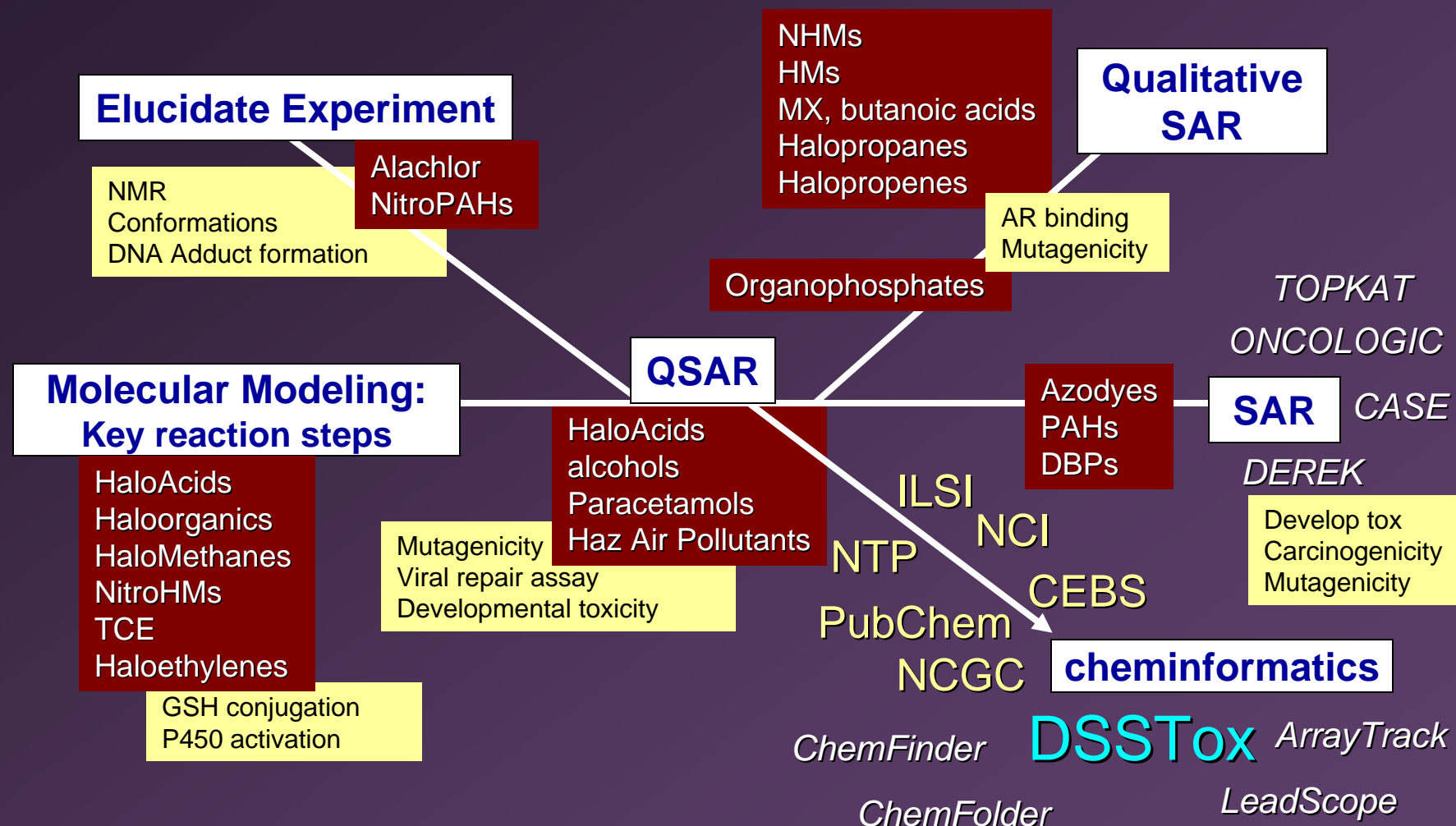
Ann Richard

National Center for Computational Toxicology  
US Environmental Protection Agency



# Past Lives:

## Molecular modeling, SAR, Chemoinformatics

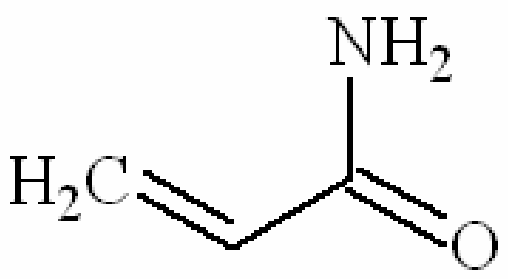


# Structure Searching Across 9 Diverse Toxicity Databases:

**Multiple Databases Search Result**

CPDBAS_v3b_1481_10Apr2006.C...	1481	1
DBPCAN_v3b_209_10Apr2006.CF...	209	0
EPAFHM_v3b_617_10Apr2006.CF...	617	0
FDAMDD_v2b_1217_10Apr2006.C...	1217	0
HPVCSI_v1a_3548_10Apr2006.C...	3548	1
IRISSI_v1a_544_10Apr2006.CF...	544	1
NCTREER_v3b_232_10Apr2006.CF...	232	0
NTPBSI_v1a_2415_10Apr2006.C...	2415	1
NTPHTS_v1a_1408_10Apr2006.c...	1408	2

Query  
Chemical Structure



☐ Show Atoms Numbering

Open DB  
Merge All...  
Load...  
Save...  
OK  
Cancel  
Help

**Exact match search  
for Acrylamide:**

**Result: 6 hits**

# Generalized Sub-Structure Searching Across 9 Diverse Toxicity Databases:

Multiple Databases Search Result

CPDBAS_v3b_1481_10Apr2006.C...	1481	139
DBPCAN_v3b_209_10Apr2006.CF...	209	2
EPAFHM_v3b_617_10Apr2006.CF...	617	31
FDAMDD_v2b_1217_10Apr2006.C...	1217	308
HPVCSI_v1a_3548_10Apr2006.C...	3548	81
IRISSI_v1a_544_10Apr2006.CF...	544	35
NCTRER_v3b_232_10Apr2006.CF...	232	7
NTPBSI_v1a_2415_10Apr2006.C...	2415	154
NTPHTS_v1a_1408_10Apr2006.c...	1408	79

Query

View 15/35 hits in EPA IRIS

Any atom attached by single or double bond

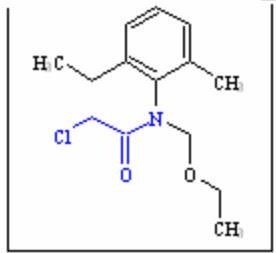
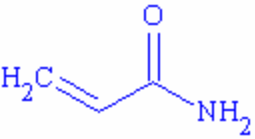
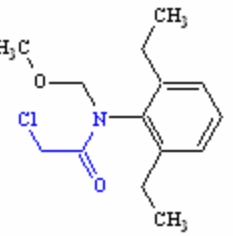
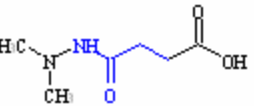

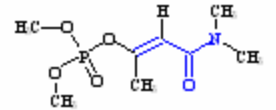
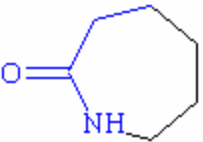
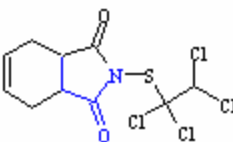
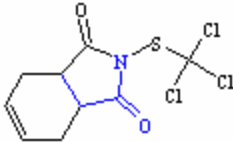
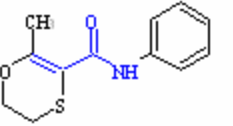
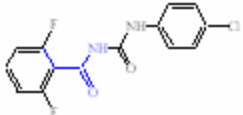
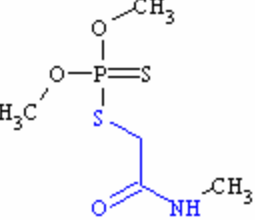
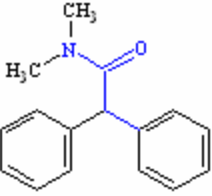
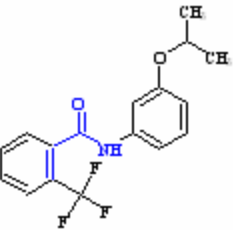
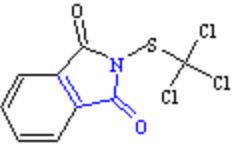
Chemical structure: NC(=O)C

Open DB  
Merge All...  
Load...  
Save...  
OK  
Cancel  
Help

Result: 836 hits

# Generalized Sub-Structure Searching Across 9 Diverse Toxicity Databases:

## *15/35 Hits in IRIS containing acrylamide-like moiety*

<p>ID:5 <input type="checkbox"/></p>  <p>Acetochlor 34256-82-1</p>	<p>ID:12 <input type="checkbox"/></p>  <p>Acrylamide 79-06-1</p>	<p>ID:16 <input type="checkbox"/></p>  <p>Alachlor 15972-60-8</p>	<p>ID:17 <input type="checkbox"/></p>  <p>Daminozide 1596-84-5</p>	<p>ID:58 <input type="checkbox"/></p>  <p>Bentazon 25057-89-0</p>
<p>ID:71 <input type="checkbox"/></p>  <p>Bidrin 141-66-2</p>	<p>ID:99 <input type="checkbox"/></p>  <p>Caprolactam 105-60-2</p>	<p>ID:100 <input type="checkbox"/></p>  <p>Captafol 2425-06-1</p>	<p>ID:101 <input type="checkbox"/></p>  <p>Captan 133-06-2</p>	<p>ID:108 <input type="checkbox"/></p>  <p>Carboxin 5234-68-4</p>
<p>ID:206 <input type="checkbox"/></p>  <p>Diflubenzuron 35367-38-5</p>	<p>ID:210 <input type="checkbox"/></p>  <p>Dimethoate 60-51-5</p>	<p>ID:229 <input type="checkbox"/></p>  <p>Diphenamid 957-51-7</p>	<p>ID:266 <input type="checkbox"/></p>  <p>Flutolanil 66332-96-5</p>	<p>ID:268 <input type="checkbox"/></p>  <p>N-(Trichloromethylthio)phthalimide 133-07-3</p>

# Relational Biological Content Searching: Carcinogenic Potency Database – All Species (CPDBAS\_1481)

ACD/ChemFolder: Database Window

Database View Record Search Reaction Lists Options ACD/Labs Help

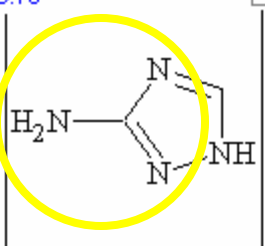
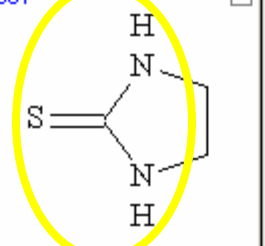
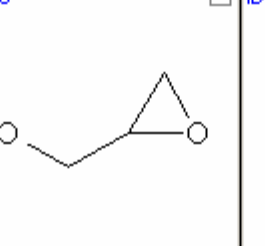
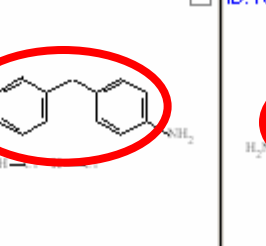
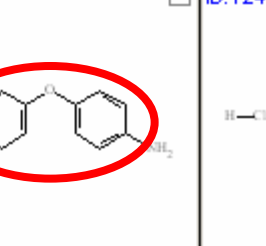
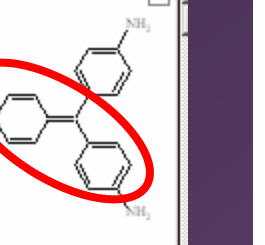
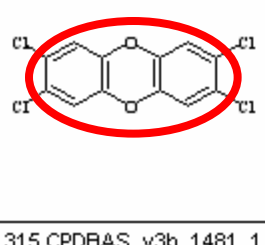
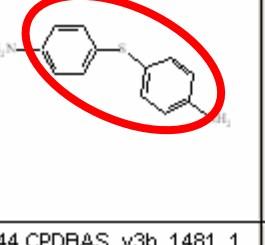
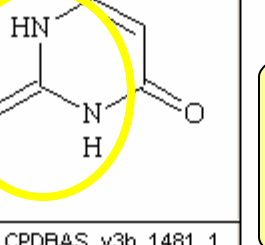
Search database for all compounds satisfying dual condition:  
**FieldName=TargetSites\_Rat\_Male, Value=thy (thyroid)**  
& **FieldName=TargetSites\_Mouse\_Male, Value=liv (liver)**

**Search Data**

	Data Name(s):	Condition:	Value:
x	TargetSites_Rat_Male	Includes	thy
x	AND		
	TargetSites_Mouse_Male	Includes	liv

☐ Case Sensitive

More Less Query... OK Cancel Help

ACD/ChemFolder: Database Window - [D:\DSSTOX_MISC\ACD_CHEMFOLDERFILES_10APR2006\CPDBAS_V3B_1481_10APR2006.CFD]					
Database View Record Search Reaction Lists Options ACD/Labs Help					
<p>ID:76 <input type="checkbox"/></p>  <p>76 CPDBAS_v3b_1481_10A 3-Aminotriazole negative thy pit thy liv liv</p>	<p>ID:601 <input type="checkbox"/></p>  <p>601 CPDBAS_v3b_1481_10 Ethylene thiourea (ETU) positive thy thy liv pit thy liv pit thy</p>	<p>ID:666 <input type="checkbox"/></p>  <p>666 CPDBAS_v3b_1481_10 Glycidol positive ezy lgi mgl nrv per ski sto thy cli hmo mgl nrv orc sto thy hag liv lun ski sto hag mgl ski sub ute</p>	<p>ID:871 <input type="checkbox"/></p>  <p>871 CPDBAS_v3b_1481_10 4,4'-Methylenedianiline dihyd positive liv thy thy adr liv thy hmo liv thy</p>	<p>ID:1094 <input type="checkbox"/></p>  <p>1094 CPDBAS_v3b_1481_1 4,4'-Oxydianiline positive liv thy liv thy hag liv hag liv thy</p>	<p>ID:1247 <input type="checkbox"/></p>  <p>1247 CPDBAS_v3b_1481_1 C.I. Basic red 9 monohydroc positive ezy liv ski sub thy ezy sub thy liv adr liv</p>
<p>ID:1315 <input type="checkbox"/></p>  <p>1315 CPDBAS_v3b_1481_1 2,3,7,8-Tetrachlorodibenzo-p negative orc thy liv lun liv liv thy</p>	<p>ID:1344 <input type="checkbox"/></p>  <p>1344 CPDBAS_v3b_1481_1 4,4'-Thiodianiline positive ezy lgi liv thy ezy thy ute liv thy liv thy</p>	<p>ID:1347 <input type="checkbox"/></p>  <p>1347 CPDBAS_v3b_1481_1 Thiouracil thy thy liv liv</p>	<p><b>Search Results: 9 hits / 1481 total</b>  <b>TargetSites_Rat_Male = thyroid</b>  <b>&amp; TargetSites_Mouse_Male = liver</b></p>		

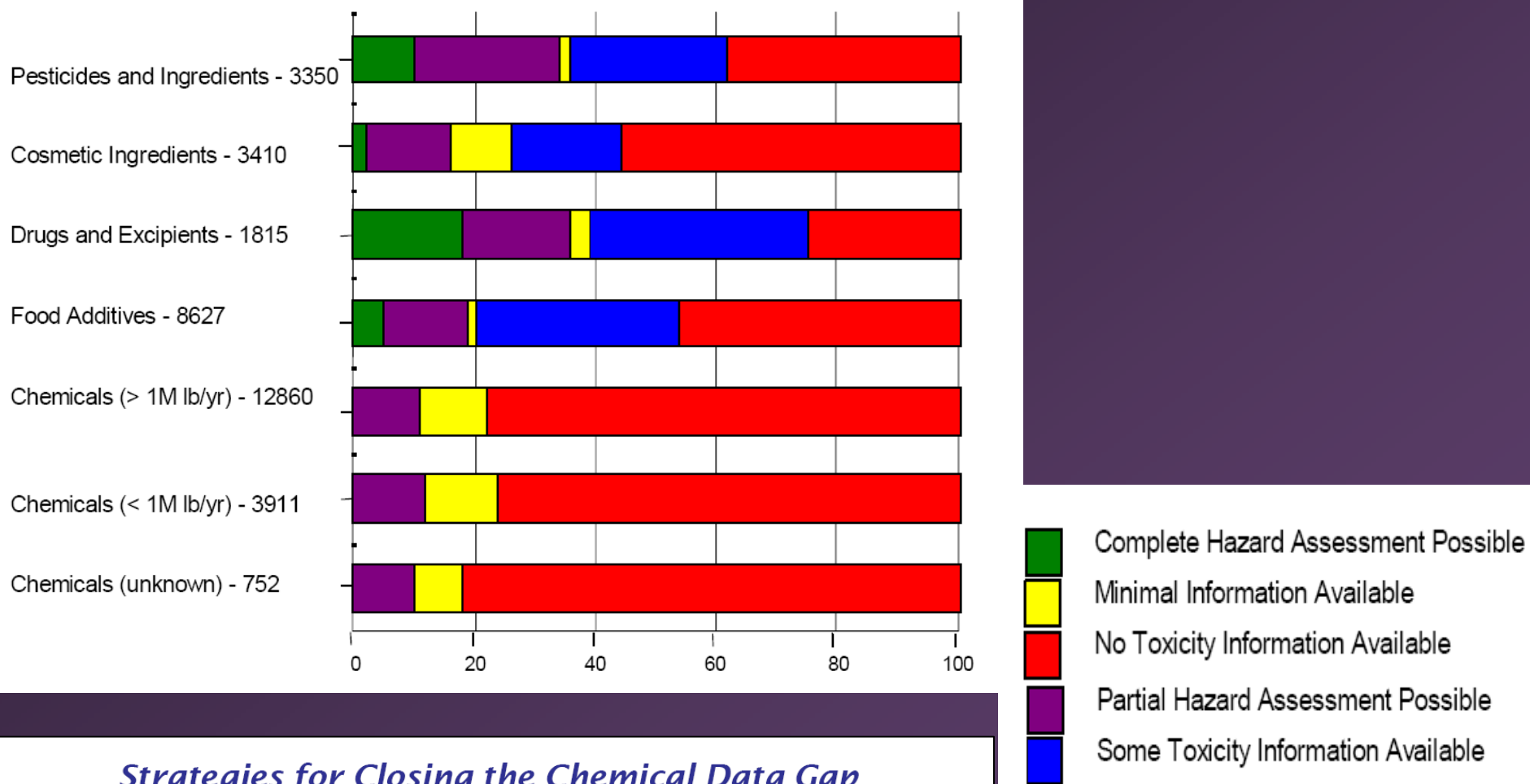
# Part I.

## The Problem



# Environmental Chemicals: Toxicity Assessment Data Gaps

## Estimated Mean Percent in Selected Universe



## Strategies for Closing the Chemical Data Gap

by John S. Applegate and Katherine Baer

# EPA Problems:

- ✦ Large lists of chemicals to evaluate
- ✦ Many toxicity endpoints to assess
- ✦ Lack of sufficient and relevant data

Need to prioritize and focus limited resources on chemicals and problem areas with potential for greatest health & environmental impact

**Inerts**

**TSCA/PMN**

Endocrine Disruption  
Testing Program

**HPV Testing Pgm**

**Water  
CCL**

**Pesticides**

# EPA ORD Human Health Risk Assessment Strategy Document

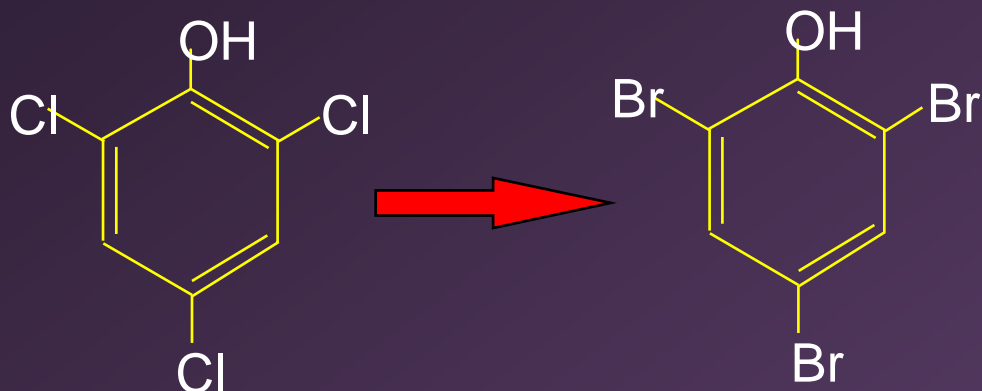
## ***Cross-Chemical Extrapolation***

A major need in risk assessment is to *improve methods for addressing the large numbers of chemicals for which little or no toxicity data are available.*

...

This extrapolation procedure assumes that the behavior of chemicals in biological systems ... can be inferred or projected based on *analogies* and correlations to structural, physicochemical, or electronic aspects of the parent compound or its metabolites. The underlying bases of these analogies and correlations is that *these commonalities will cause the chemicals to behave in a parallel manner in biological systems, i.e., they will possess a common mode-of-action.*

# EPA Regulatory Action on 2,4,6-tribromophenol

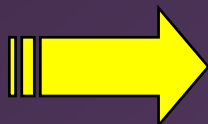


2,4,6-trichlorophenol

genotoxic  
forms free radicals  
DNA reactive  
rodent carcinogen  $\longrightarrow$

2,4,6-tribromophenol

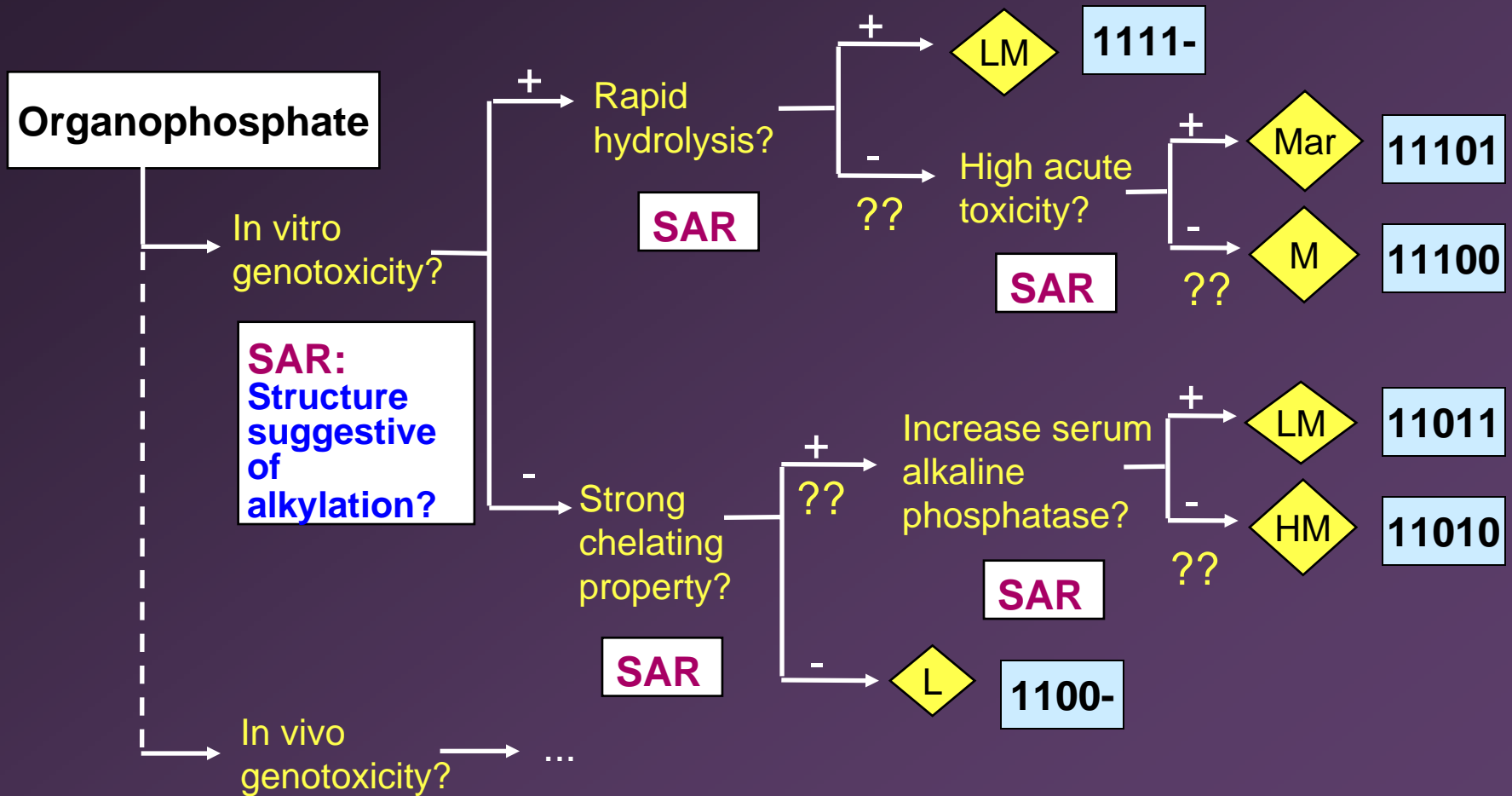
genotoxic  
forms free radicals  
DNA reactive  
???



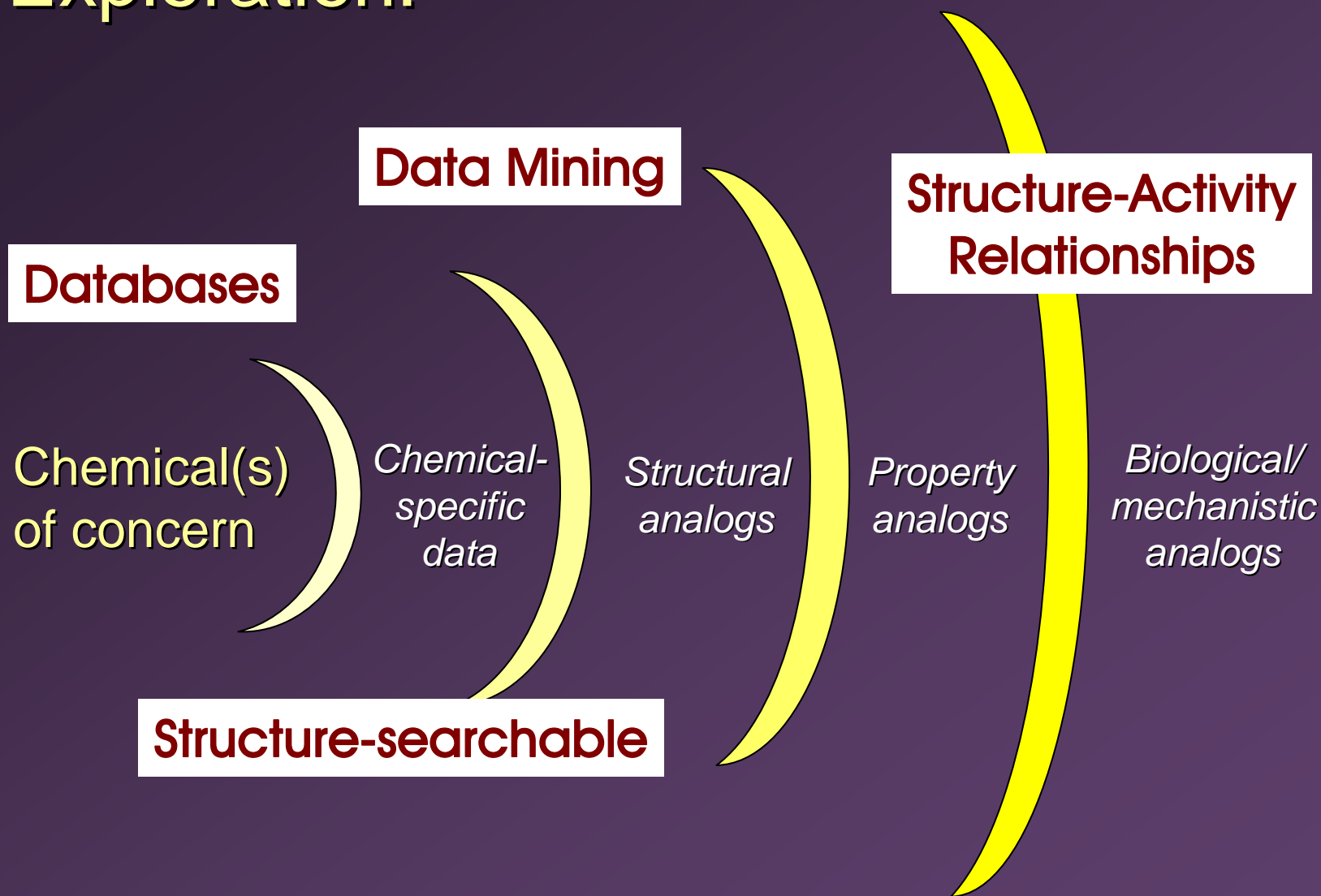
*Chemical structural analogy*  
*Biological mechanism analogy*

# Combining SAR and Biofunctional Information

## Predicting Carcinogenicity of Organophosphates



# Chemistry-based Data Mining & Exploration:



# Part II.

## Data-Mining of Public Toxicity Databases

[EF Overview](#)[Queries, Maps, & Reports](#)[TRI eFDR](#)[Data Update](#)[Technical U](#)[Site Map](#)[Contact Us](#)**Quick Start**

View environ  
information  
Code, City,  
Use State  
Abbreviation

☒ ZIP Code☐ City, State☐ County, State**GO**[Customer S](#)

## Envirofacts Data Warehouse

[Recent Additions](#) | [Contact Us](#) | [Print Version](#)

EF Search:

**GO**[EPA Home](#) > [Envirofacts](#)

*Welcome to Envirofacts, your one-stop source for environmental information.*

The Toxic Release Inventory (TRI) 2004 Data has been released. For further details please visit <http://www.epa.gov/tri/tridata/tri04/index.htm>

## Envirofacts Master Chemical Integrator (EMCI)

[Recent Additions](#) | [Contact Us](#) | [Print Version](#)

EF Search:

**GO**[EPA Home](#) > [Envirofacts](#) > [EMCI](#) > Query Form

### Query Form

*Search the EMCI Database*

The Chemical Query Form allows you to obtain the acronyms, chemical identification numbers, and chemical names reported by the Envirofacts databases (AFS, PCS, RCRAInfo, and TRIS) using the Envirofacts Master Chemical Integrator (EMCI). You may see if the chemical is included in other groups, or is made up of other components.

[User's Guide](#)

### Chemical Selection

You may enter one or more name fragments under the Chemical Name search option, separated by a space. If you enter more than one name fragment, the "Containing" Radio Button has to be selected. All chemical names in the EMCI are searched concurrently, including CAS index names, common names, and chemical names and descriptions used by program office systems. RCRA hazardous waste codes can also be searched as name fragments. More information about entering multiple fragments is available in the [user's guide](#).

Chemical Search Option:

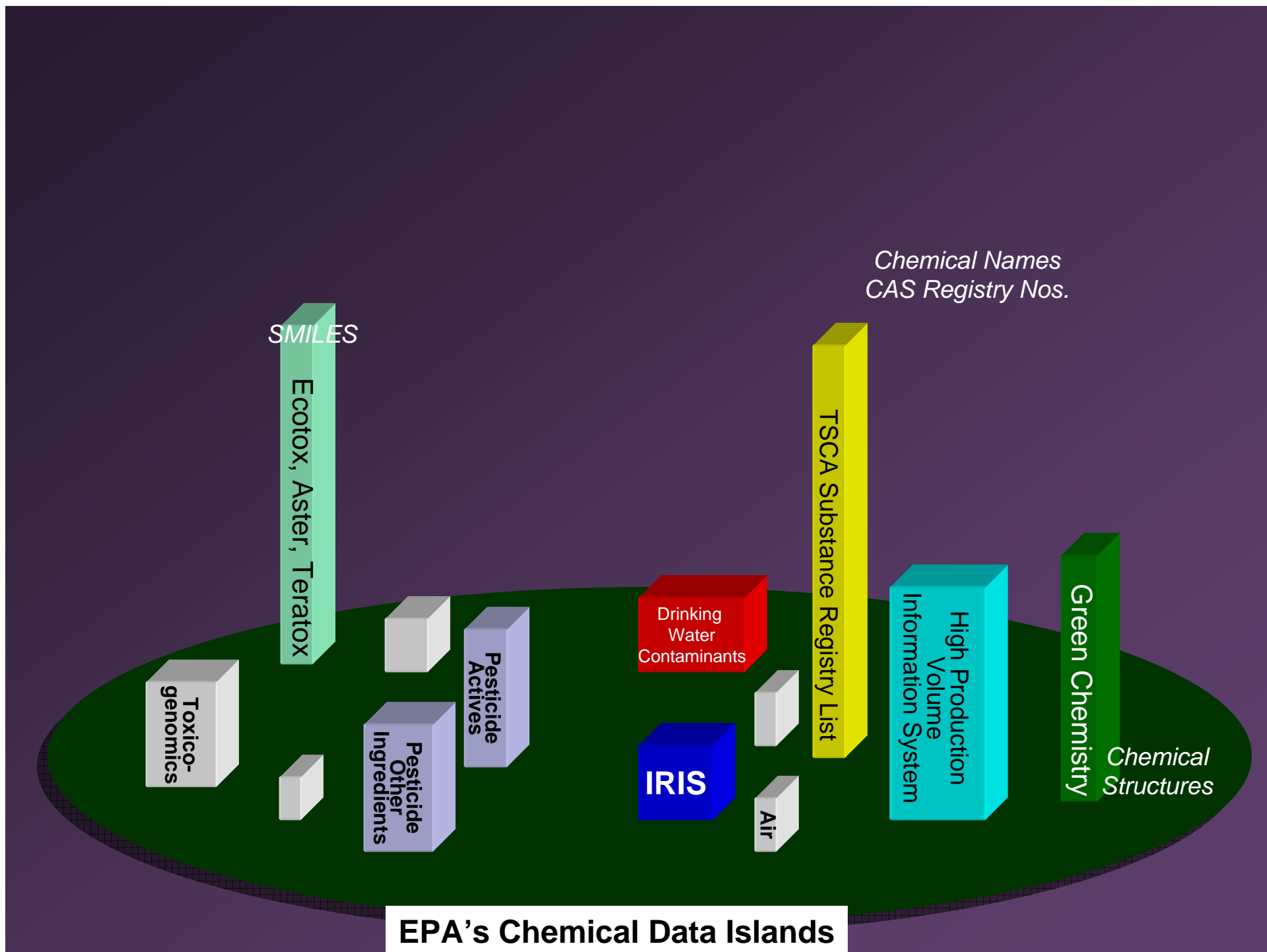
Chemical Option Value:

  
☒ Beginning With ☐ Exact Match ☐ Containing[Form R](#)  
[UV Index](#)



## Problems across EPA:

- ✦ Little or no chemical structure annotation
- ✦ No structure searching capabilities (Internet or desktop)
- ✦ No coordination of chemical structure information across EPA databases
- ✦ No standard quality review procedures for chemical information



# World Wide Web

Chemical  
structures

National  
Toxicology  
Program

National Library  
of Medicine

PubChem



European Chemicals  
Bureau (SIDS)

SMILES

Ecotox, Aster, Teratox

Toxico-  
genomics

Pesticide  
Other  
Ingredients

Pesticide  
Actives

Drinking  
Water  
Contaminants

IRIS

Air

TSCA Substance Registry List

Chemical Names  
CAS Registry Nos.

High Production  
Volume  
Information System

Green Chemistry

Chemical  
Structures

EPA's Chemical Data Islands



# National Toxicology Program

Department of Health and Human Services

[Home](#)[Testing Information](#)[Study Results & Research Projects](#)[Public Health](#)[About the NTP](#)[Help](#)

<http://ntp.niehs.nih.gov/>

**NTP Study Reports**

**Study Data Searches**

**Pathology Tables for Peer Review**

**Summaries & Associations of Study Results**

**NTP Center for Phototoxicology**

**Center for Rodent Genetics**

**New Areas of Research**



**Reports:** NTP is converting study reports into an electronic format which can be accessed from the website. These reports are made available as soon as they have been converted.

**Data Searches:** The NTP has been loading study information into databases and has developed applications to access this data from the web. There are two types of data mining searches:

- All types of data - search provides a way to find the various types of studies conducted on a test agent and has options to mine that data if it is available in electronic format.
- Bioassay pathology data mining search provides a way to access the pathology databases. It is also possible to search the historical control database and to view



Search History: [Search Results](#) > [NTP Search Home Page](#)

[Clear History](#)[Hide History](#)

## NTP Database Search Home Page

Please note: This new NTP website is a **"Work-in-Progress"** project. [Click here for a](#)

**CASRN or Chemical Name search**

### Search by CAS No. or all or part of the chemical name

☐ Check this box to limit search to **exact matches only**

**Note:** This search includes synonyms, but the search results will display the primary chemical name, the CAS number and the synonym name. For additional help, press the "Help" button in the top menu bar.

### View a list of studies with available electronic data

### Choose Study Type To Search Across Similar Studies

**Note:** This search capability is under construction. Currently only the pathology for the 2-year rodent studies stored in the Toxicology Data Management System (TDMS) since about 1983 is searchable. More than 200 studies are loaded into the database for searching and we continue to add to this set as time permits. The search looks for significant

**Off-site to search structure or analogs (NLM ChemID Plus)**

### Structure Search

Enter a CAS number or Chemical

Name:



Search History: [Search Results](#) > [NTP Search Home Page](#) > [Search Results](#) > NTP Studies on 1,1,1,2-Tetrabromoethane

[Clear History](#)[Hide History](#)

## NTP Studies on 1,1,1,2-Tetrabromoethane

### Table Instructions and Notes:

- Choose study type to view data for **1,1,1,2-Tetrabromoethane**
- Not all agents have been studied in every study type. If there are no electronically available data on **1,1,1,2-Tetrabromoethane**, you may contact the NTP Central Files ([cdm@niehs.nih.gov](mailto:cdm@niehs.nih.gov)) to request available data from completed studies or the status for ongoing studies

5 study categories

Standard Toxicology & Carcinogenesis Studies	Reproductive Studies	Developmental Studies	Immunology Studies	Genetic Toxicity Studies
<p><a href="#">Description of standard protocols</a></p> <p><b>Study C91016</b> <b>Status:</b> Rpt Complete <b>Length:</b> 3-Week <b>Route:</b> Gavage <b>Rats:</b> FISCHER 344 No data available online. <a href="#">View Study Abstract</a></p>	No Reproductive Studies Available for this Chemical	No Developmental Studies Available for this Chemical	No Immunology Studies Available for this Chemical	<p><a href="#">Description of standard protocols</a></p> <p>In Vitro Study Data</p> <ul style="list-style-type: none"><li>Salmonella</li></ul>

**View study results:**  
**Genetic toxicity studies:**  
**Salmonella**



**Search History:** [Search Results](#) > [NTP Search Home Page](#) > [Search Results](#) > [NTP Studies on 1,1,1,2-Tetrabromoethane](#) > [Salmonella S](#)

## Salmonella Study Overview

### Current Search Criteria

Chemical Name:	1,1,1,2-Tetrabromoethane
CAS Number:	630-16-0
Study Type:	Salmonella

### Table Instructions and Notes:

Click on the study number to view a summary of the results.

Standard NTP Protocol

**Study Summary Call**

Study ID	Study Result	Year Completed
<a href="#">A87711</a>	Weak Positive	1993

**View study details**

Chemical Name:	<b>1,1,1,2-Tetrabromoethane</b>
CAS Number:	<b>630-16-0</b>
Study Type:	<b>Salmonella</b>
Study ID:	<b>A87711</b>

## Summary Table

**Study Summary Call**

Study ID	Overall Result	Year Completed
A87711	Weak Positive	1993

## Table Instructions and Notes:

Click 'View Detailed Data' to proceed to the study data.

**No "Endpoint"  
Summary Calls**

Options	Strain	S9 Activation	S9 Species	Concentration
<b>View Detailed Data</b>	TA100	Yes	Hamster	10% HLI
	TA100	Yes	Rat	10% RLI
	TA100	Yes	Hamster	30% HLI
	TA100	Yes	Rat	30% RLI
	TA100	No	-	-
	TA1535	Yes	Hamster	10% HLI
	TA1535	Yes	Rat	10% RLI
	TA1535	Yes	Hamster	30% HLI
	TA1535	Yes	Rat	30% RLI

**View detailed data**



Strain: TA1538

Dose	30% RLI (Negative)		30% HLI (Negative)	
	Mean	Std. Error	Mean	Std. Error
ug/Plate				

Vehicle Control 100 200 400 600 800 1000

Individual  
experiment results

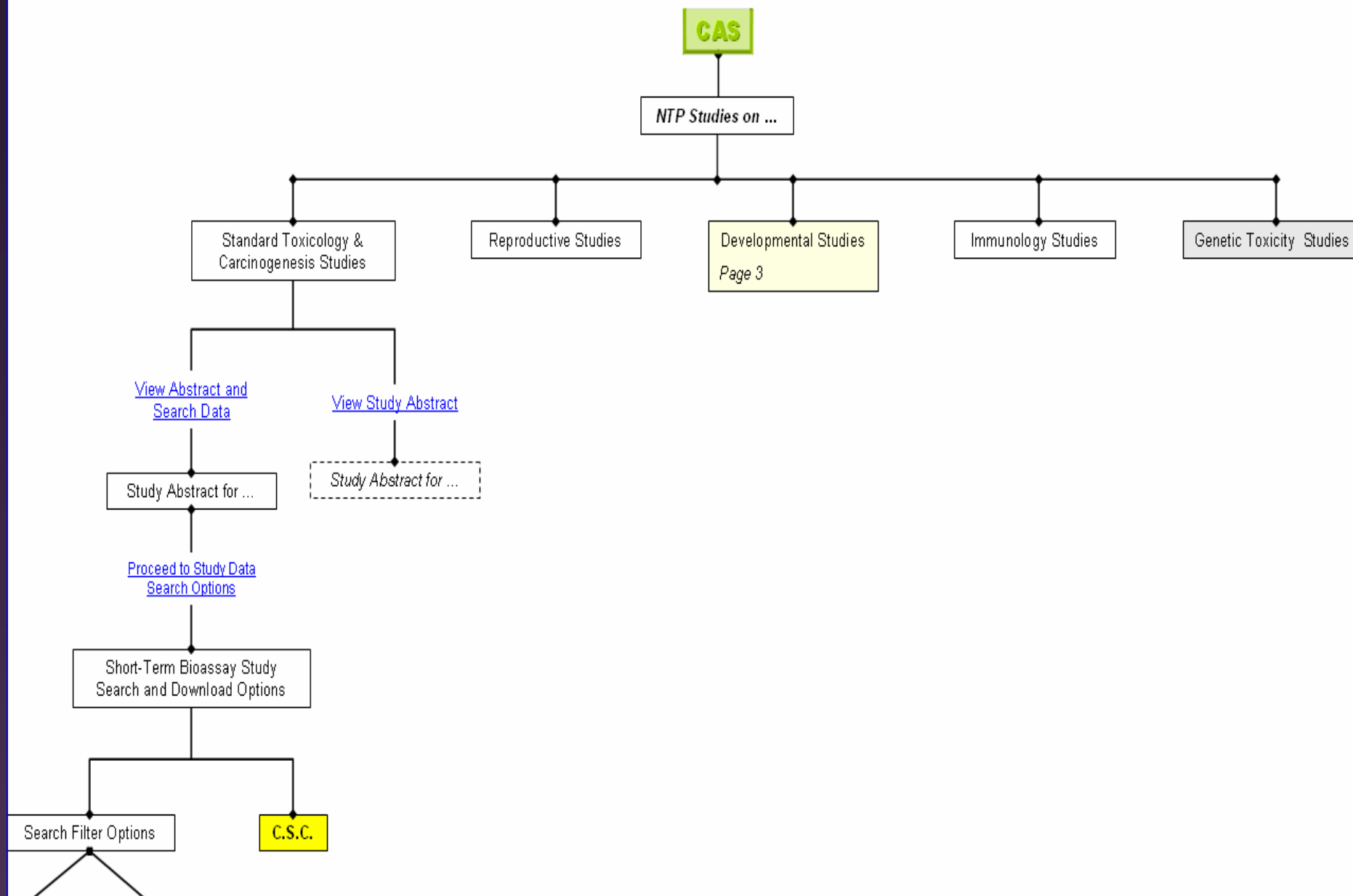
Positive Control

Strain: TA97

Dose		10 (Ne
ug/Plate		Mean
Vehicle Control		179
100		168
200		192
400		T
600		T
800		T
Positive Control		734
		28 376 14.40 1621 36.40 678 19.90

- ✦ Cannot download entire list of NTP chemicals and test summary data
- ✦ Cannot structure or substructure-search database
- ✦ Cannot download subsets of data:
  - ✦ list of TA98 pos data
  - ✦ list of all thyroid tumor carcinogens
- ✦ Cannot ask relational questions of data:
  - ✦ what chemicals are TA100 neg + TA98 pos?
  - ✦ list all chemicals with positive rat liver tumor findings in cancer bioassay that are also non-mutagenic

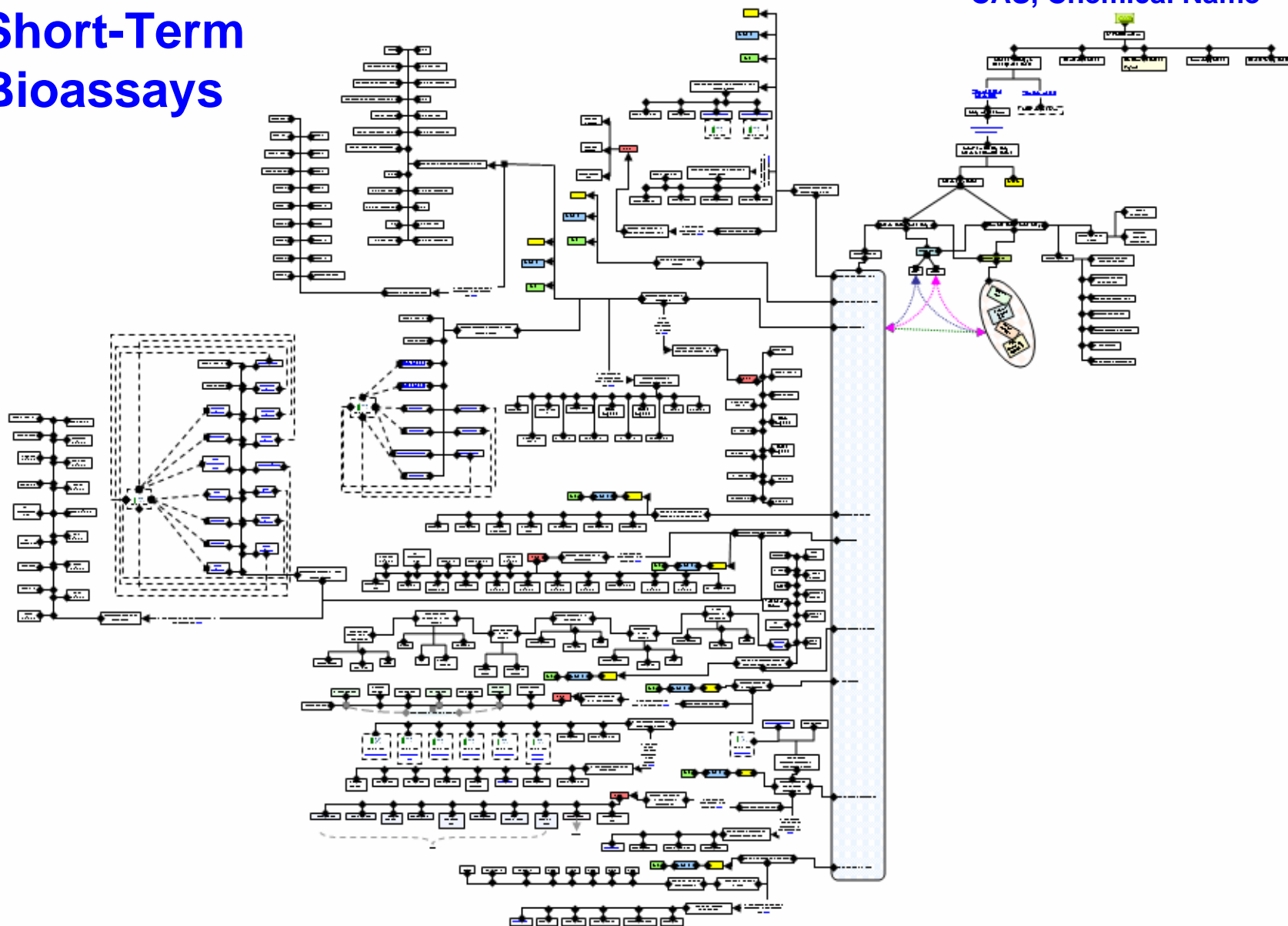
# NTP Database Site Map



# NTP Database Site Map

## Short-Term Bioassays

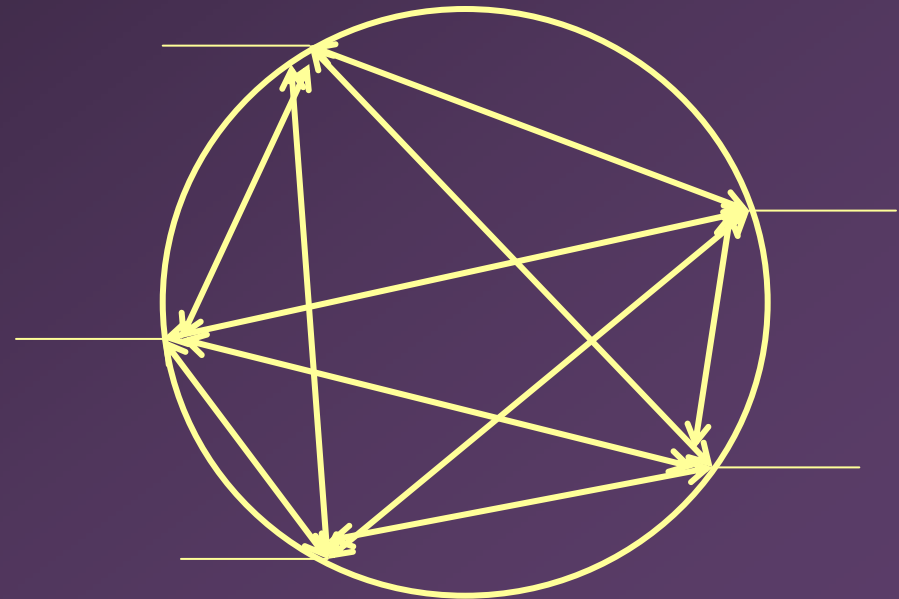
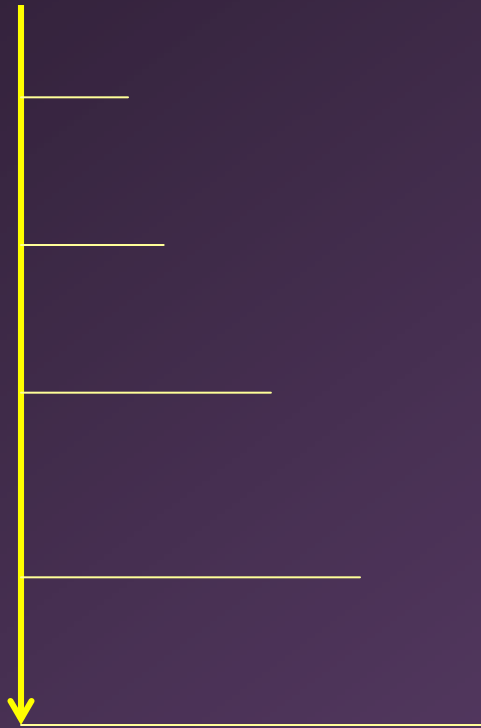
CAS, Chemical Name

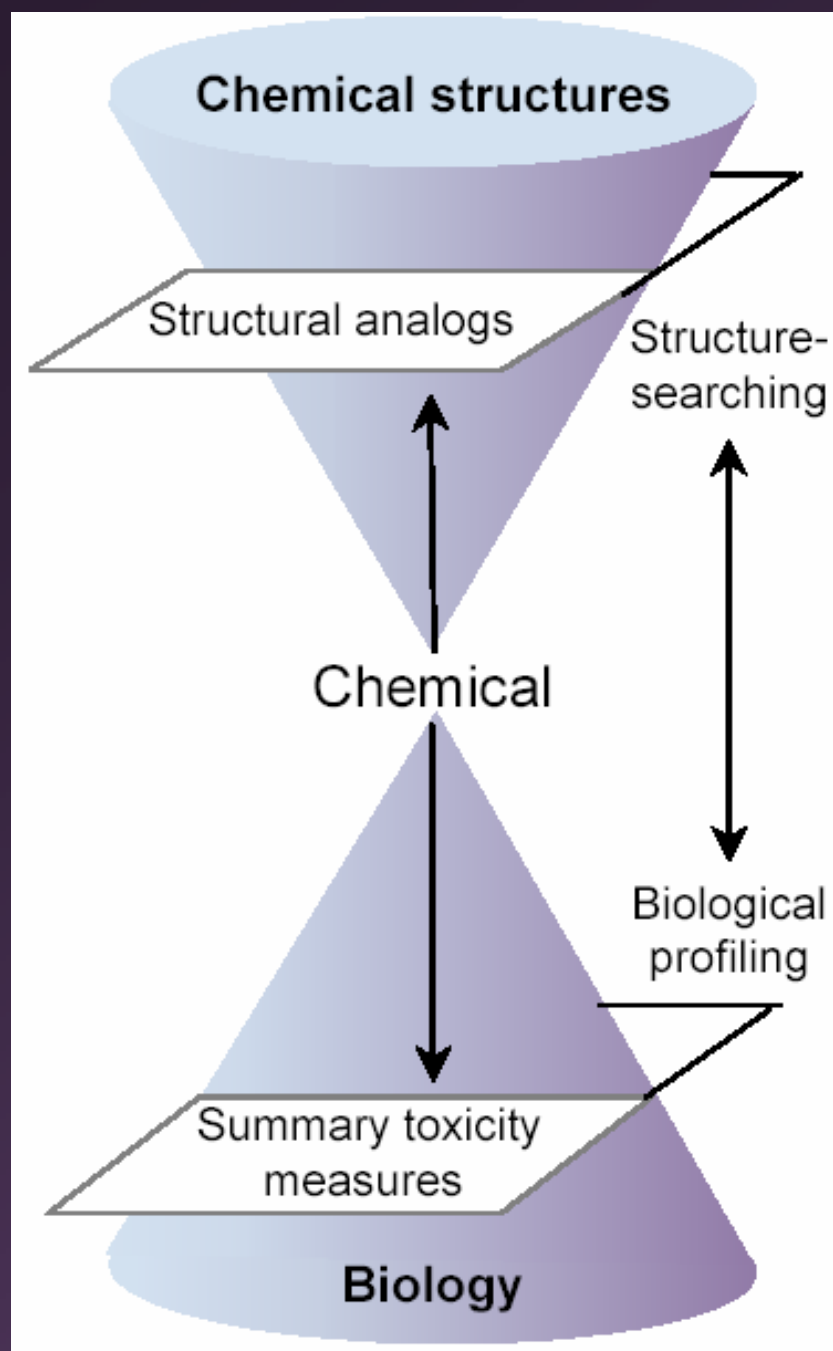


Archival

vs.

Relational





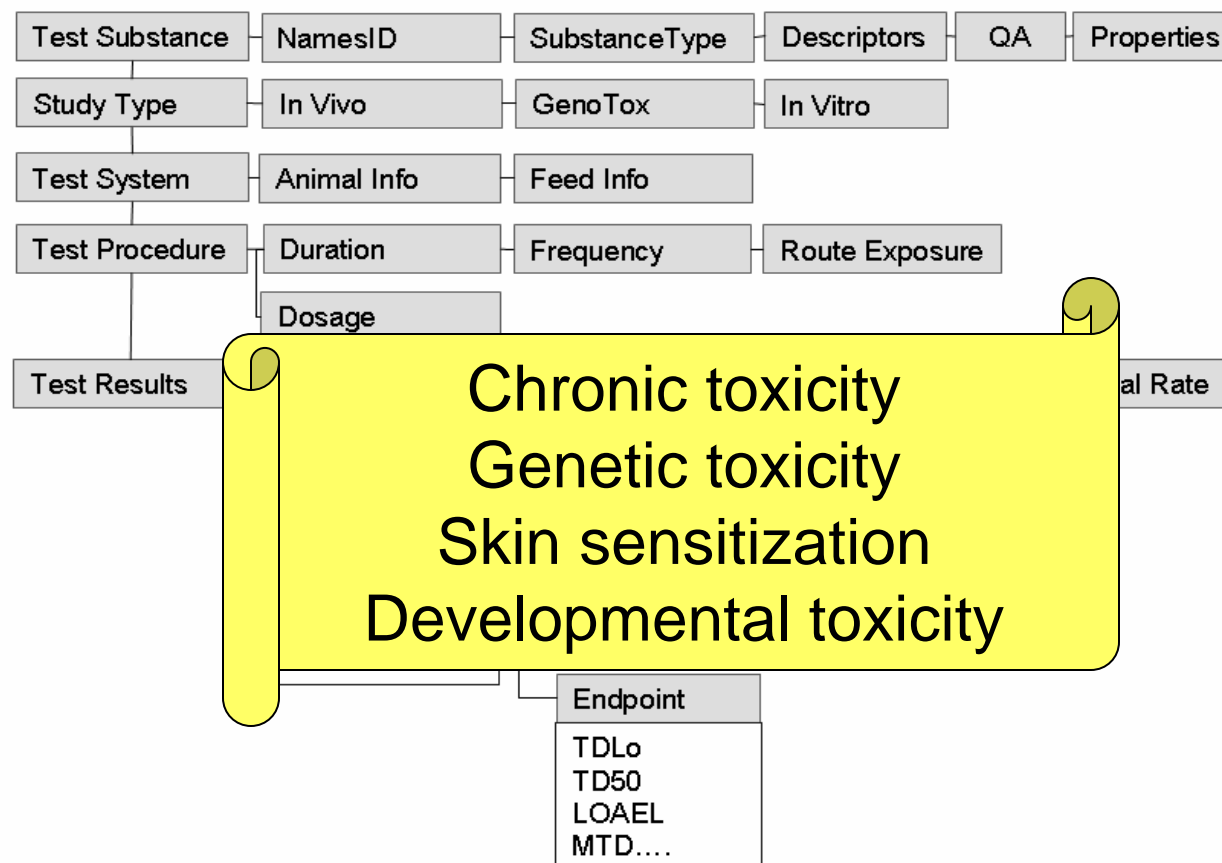
Yang et al (2006) Landscape of current toxicity databases and database standards. *Curr Opinion Drug Discov Develop* 9(1),124-133.

Yang et al (2006) The art of data mining the minefields of toxicity databases to link chemistry to biology. *Curr Comput-Aided Drug Design*, 2(2), 135-150.

# ToxML Public Data Model Schemas

*LIST Consortium*

## Toxicity Content Model



Standard data forms

Controlled vocabulary

Hierarchical field structure

Toxicity domain expert involvement

XML format

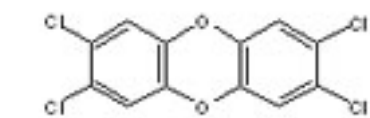
Top-level chemical indexing

*FDA CDER/CFSAN ToxML Database Collaborations*

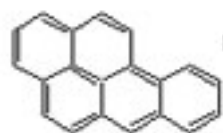


# Part III.

## The DSSTox Project

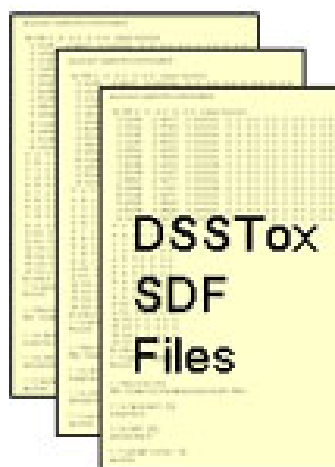


Chemical Str



## Chemical structure-annotation

Distributed  
Structure-Searchable  
Toxicity  
Public  
Database  
Network



## Data standards and integration

Prediction  
Models



DSSTox Public Website: <http://www.epa.gov/ncct/dsstox/>

U.S. Environmental Protection Agency



## Distributed Structure-Searchable Toxicity (DSSTox) Public Database Network

### DSSTox Chemical Information Quality Review Procedures

#### Searching DSSTox SDF Files in PubChem

#### SDF Viewers, Structure Browsers & CRD Applications

#### SDF Download Page:

#### EPAFHM: EPA Fathead Minnow Acute Toxicity Database File

#### New to Version 3b Database File, updated 10Apr2006

- Revised DSSTox Standard Chemical Fields (August 2005), see [More on DSSTox Standard Chemical Fields](#)
- Updated IUPAC names and InChI codes (v. 1.0), see [More on InChI](#)
- Major chemical data quality review, see [DSSTox Chemical Information Quality Review Procedures](#)
- Revised tox-related field names

For details, see [Version 3 Update](#) notes below.

For notes on past version updates, see [EPAFHM LogFile](#)

#### Quick & Easy File Downloads: [FTP Download Instructions](#)

- [Description](#)
- [Source Website](#)
- [Source Contact](#)
- [Main Citation](#) [Download](#)
- [Guidance for Use](#)
- [SDF Fields](#)
- [SDF Content Summary](#)
- [SDF Download Table](#) [Download](#)
- [Acknowledgements](#)
- [DSSTox Citation](#)
- [Disclaimer](#)

#### Addition

**Description:** The EPA Fathead Minnow Acute Toxicity database was generated by the U.S. EPA Mid-Continental Ecology Division (MED) for the purpose of developing an expert system to predict acute toxicity from chemical structure based on mode of action considerations. Hence, an important and unusual characteristic of this toxicity database is that the 617 tested industrial organic chemicals were expressly chosen to serve as a useful training set for development of predictive quantitative

About DSSTox

Work in Progress

Frequent Questions

Structure Data Files

Central Field Definition Table

Apps, Tools & More

DSSTox Community

Site Map

Glossary of Terms

Help

Recent  
EPA Home  
Databases

DS  
Distr  
Data  
Toxic  
impro  
DSST  
stand  
More>

\*\*\*Re

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• HF

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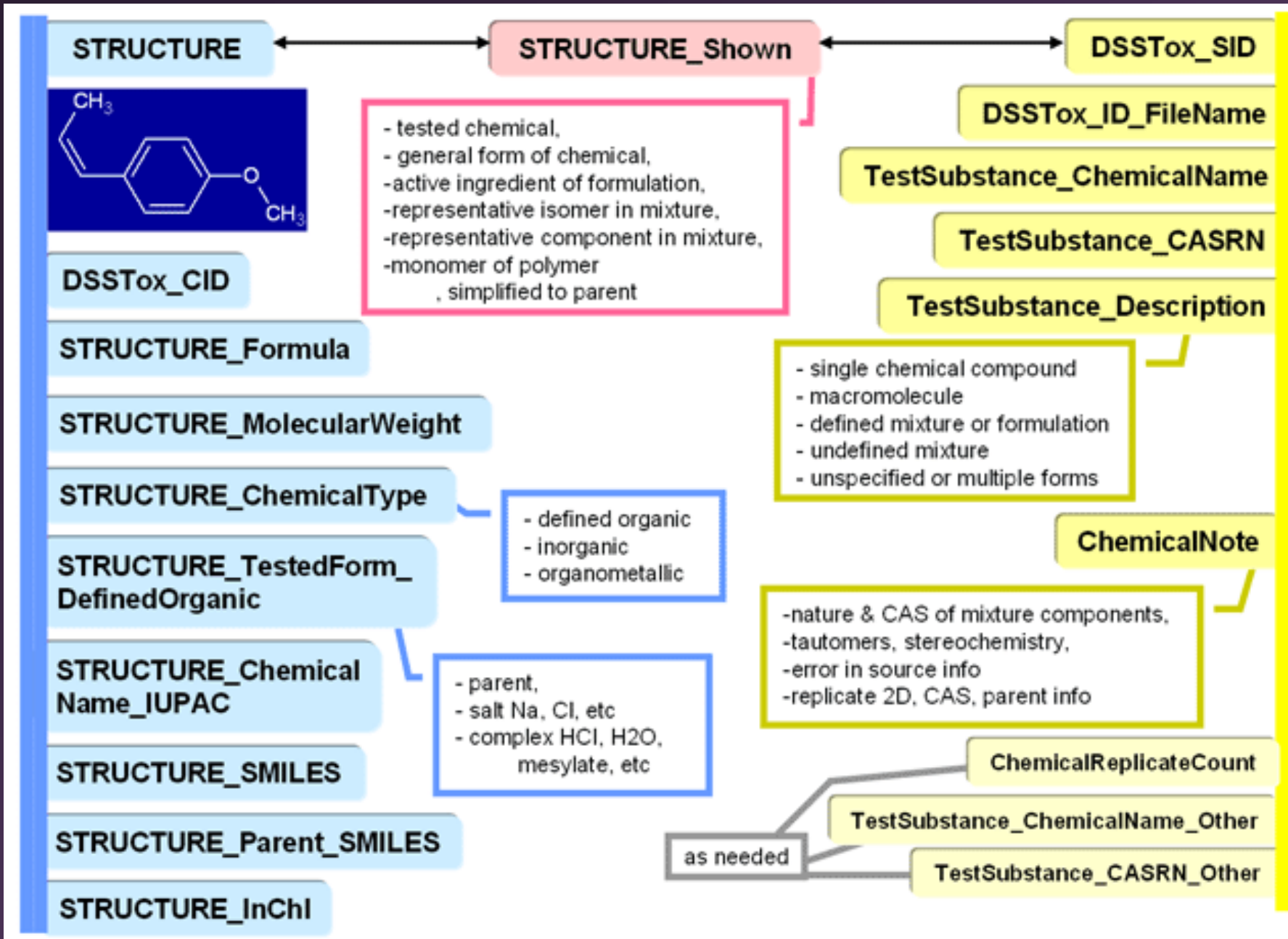
• DS

\*\*\*Ex

(CPD

• Added chem  
• Activity Cate  
pages on CPDB

# DSSTox Standard Chemical Fields:



8804 total records

## DSSTox Master Structure-Index File

Carcinogenic Potency Database

EPA Disinfection By-products Cancer Predictions ✦

EPA Fathead Minnow Acute toxicity ✦

NCTR Estrogenic Activity

FDA Drug Maximum Daily Dose

EPA High Production Volume SI ✦

NTP Bioassay SI ✦

EPA IRIS SI ✦

NTP High Throughput Screening SI ✦

*NTP Immunotoxicity Testing Battery* ✦

*DEMETERA Pesticides Ecotoxicity* ✦

*NTP Genetic Toxicity - Zeiger* ✦

*NCTR Androgenic Activity*

*NIEHS/NTP CEBS SI* ✦

*ICCVAM Endocrine Disruption Set SI*

*EPA Pesticide ToxCast Candidates SI* ✦

*EPA Developmental Neurotox SI* ✦

*EPA Pesticide Active Ingredients SI* ✦

*EPA Drinking Water Contaminants SI* ✦

*EPA Pesticide Other Ingredients SI* ✦

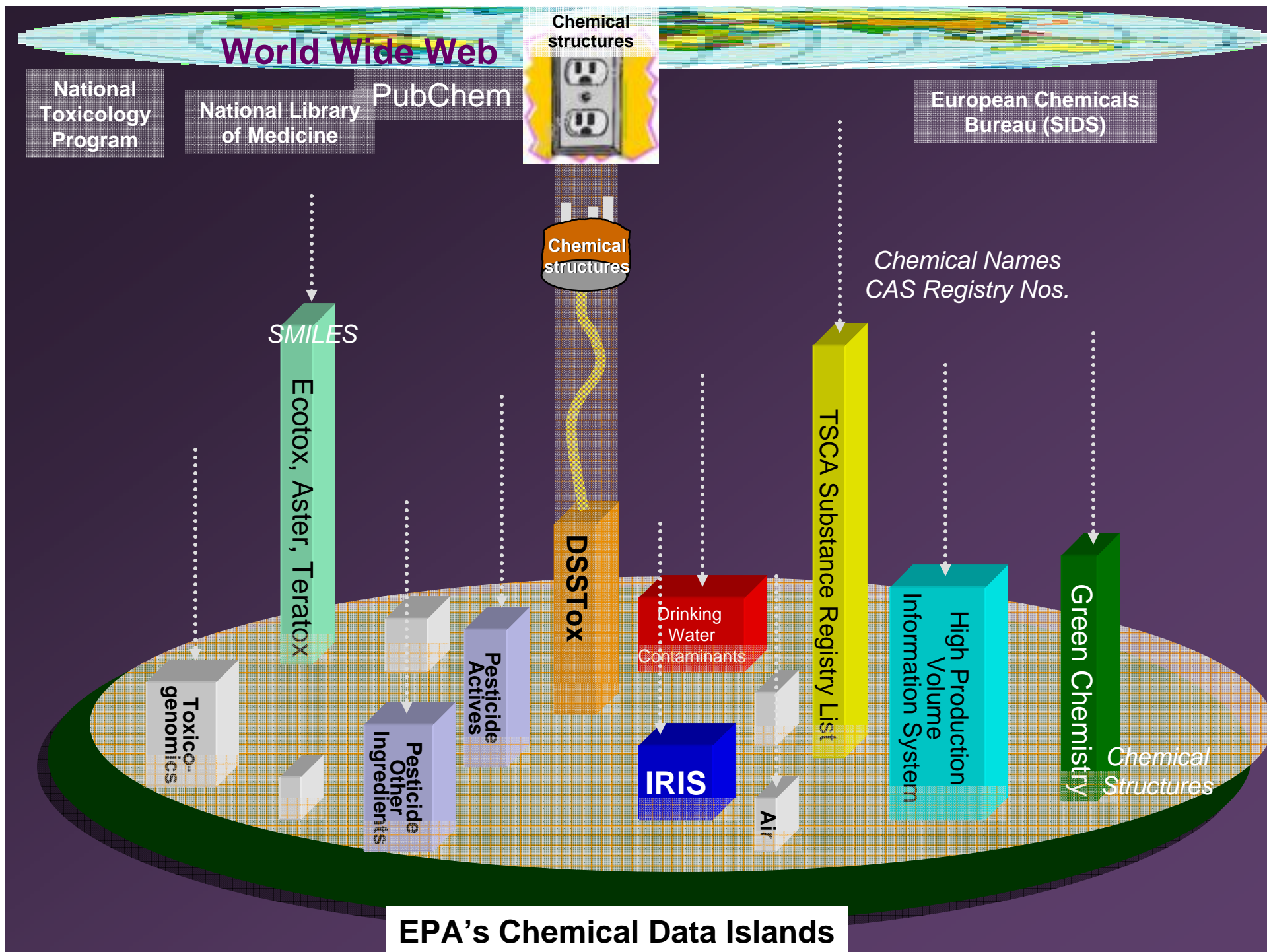
Published  
Databases

Published  
Structure-Index Files

Databases  
in development

Unpublished  
Structure-Index Files

#	NAMEID	DSSTox Master_v1a
1	CPDBAS	v3b_1481
2	DBPCAN	v3b_209
3	EPAFHM	v3b_617
4	ICTRER	v3b_232
5	FDAMDD	v2b_1217
6	HPVCSI	v1a_3548
7	HTPBSI	v1a_2415
8	IRISSI	v1a_544
9	HTPHTS	v1a_1408
10	IMMTOX	v1a_87
11	ECODEM	v1a_399
12	HTPGTZ	v1a_1931
13	ICTRAR	v1a_202
14	CEBSSI	v1a_20
15	ICCVAM	v1a_87
16	EPAPTC	v1a_826
17	EPADHT	v1a_82
18	EPAPAI	v1a_873
19	EPADWC	v1a_66
20	EPAPOI	v1a_441



# DSSTox Master Structure-Index File:

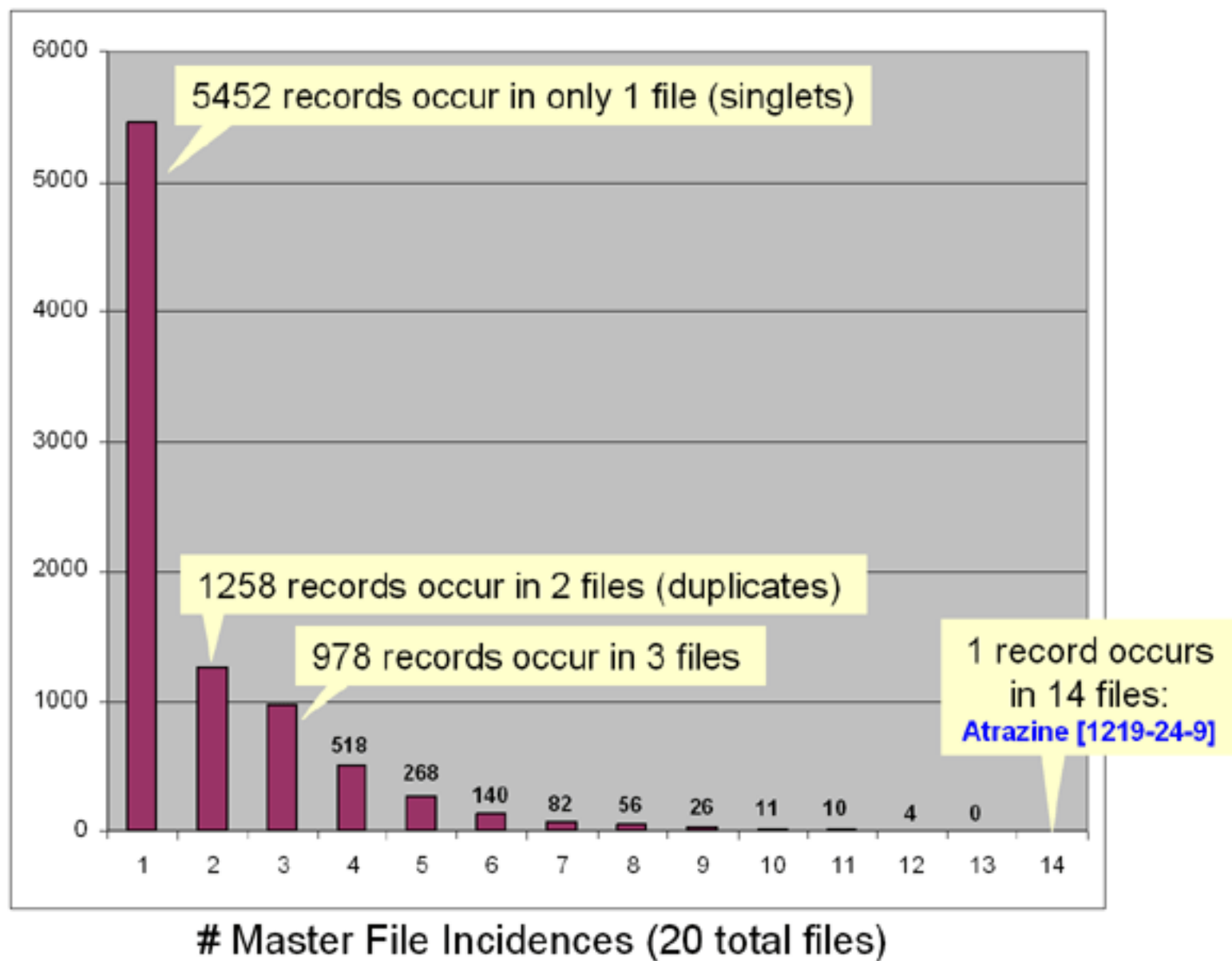
### Purpose:

to consolidate, manage, and ensure quality and uniformity of the chemical and substance information spanning all DSSTox Databases and Structure-Index files

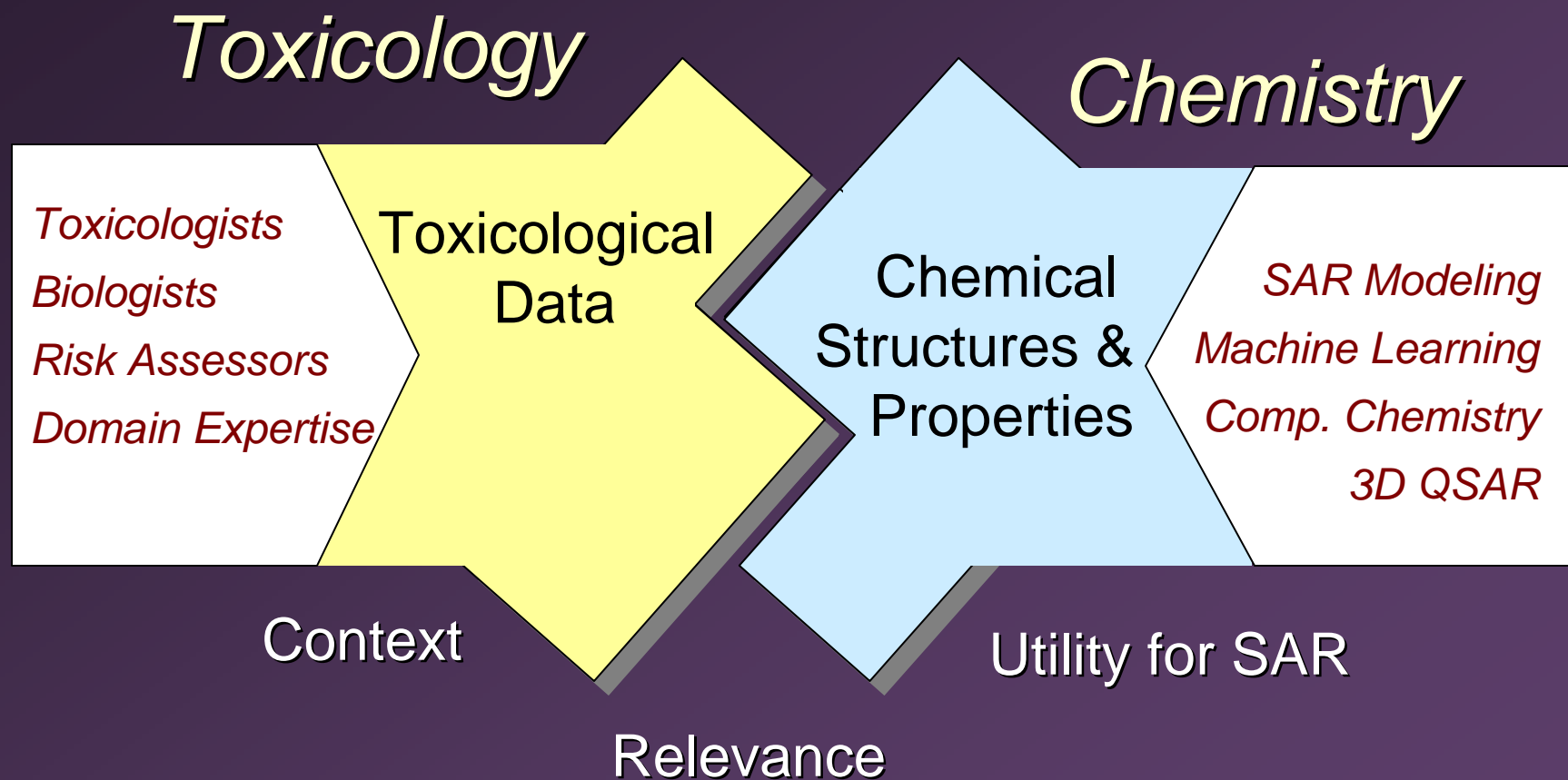
[illegible]



Total # Chemical Records  
DSSToxMaster\_v1a



# DSSTox Database Design:



# IMMTOX: Immunotoxicity Test Battery

- ✦ 88 chemicals
- ✦ 18 immunotox measures
- ✦ Summary calls
- ✦ Usage categories


















































FUNDAMENTAL AND APPLIED TOXICOLOGY **10**, 2-19 (1988)

## METHODS EVALUATION

Development of a Testing Battery to Assess Chemical-Induced  
Immunotoxicity: National Toxicology Program's Guidelines  
for Immunotoxicity Evaluation in Mice

MICHAEL I. LUSTER,\* ALBERT E. MUNSON,† PETER T. THOMAS,‡  
MICHAEL P. HOLSAPPLE,† JAMES D. FENTERS,‡ KIMBER L. WHITE, JR.,†  
LLOYD D. LAUER,§ DORI R. GERMOLEC,\* GARY J. ROSENTHAL,\* AND JACK H. DEAN§

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P.O. Box 12233, Research Triangle Park, NC 27709  
Medical College of Virginia  
Division, IIT Research Institute  
Toxicology, Department of

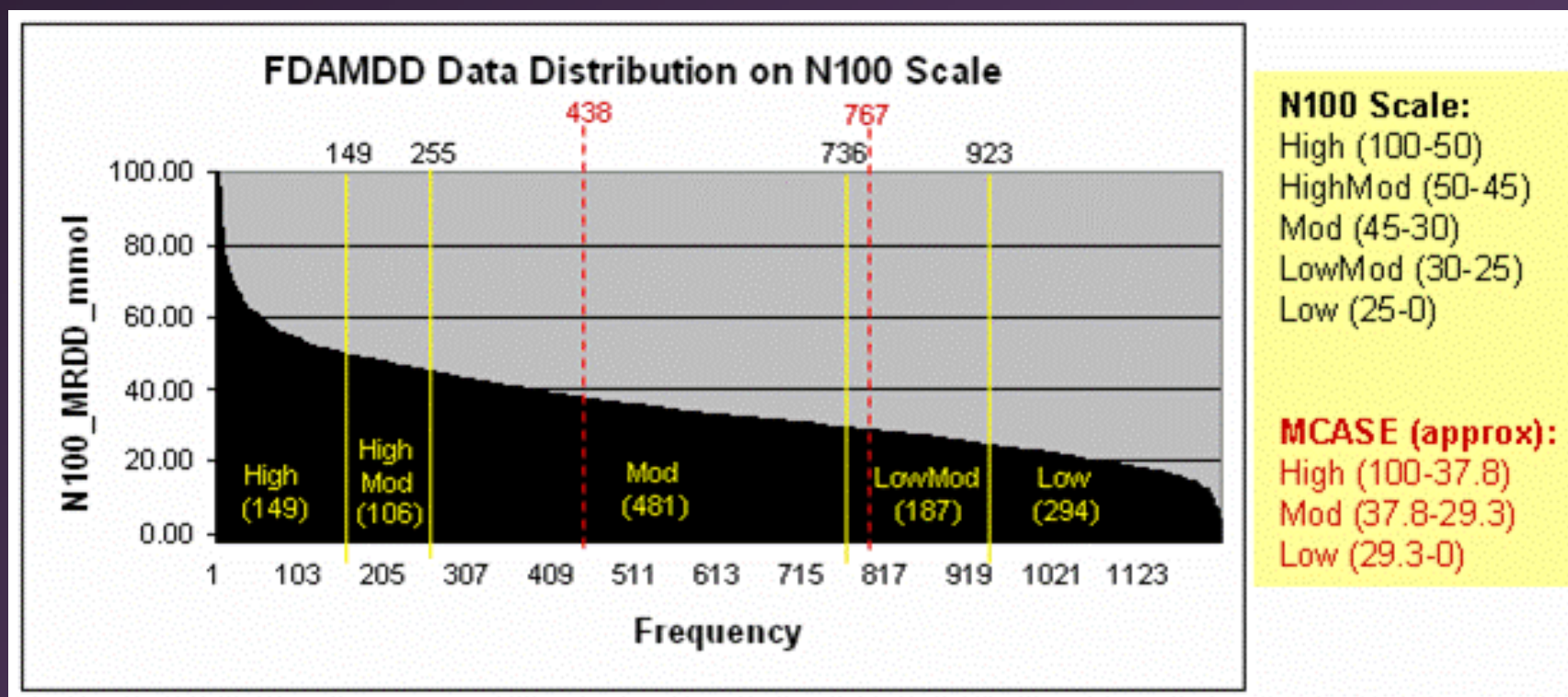
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acetonitrile 75-05-8	aldicarb oxime 116-06-3	Allyl isovalerate 2835-39-4	arsine 7784-42-1	Azathioprine 446-86-6	Benzidine 92-87-5	Benzo(a)pyrene 50-32-8	Benzo(e)pyrene 192-97-2	o-benzyl-p-chloro 120-32-1	t-Butylhydroquinone 1948-33-0
<b>ID:11</b> 	<b>ID:12</b> 	<b>ID:13</b> 	<b>ID:14</b> 	<b>ID:15</b> 	<b>ID:16</b> 	<b>ID:17</b> 	<b>ID:18</b> 	<b>ID:19</b> 	<b>ID:20</b> 
Cadmium chloride 10108-64-2	4-Chloro-o-phen 95-83-0	2,4-Diaminotoluene 95-80-7	Dideoxyadenosine 4097-22-7	Diethylstilbestrol 56-53-1	Dimethylbenz(a) 57-97-6	Dimethylvinyl chl 513-37-1	Diphenylhydantoin 57-41-0	ethyl carbamate 51-79-6	Ethylene dibromide 106-93-4
<b>ID:21</b> 	<b>ID:22</b> 	<b>ID:23</b> 	<b>ID:24</b> 	<b>ID:25</b> 	<b>ID:26</b> 	<b>ID:27</b> 	<b>ID:28</b> 	<b>ID:29</b> 	<b>ID:30</b> 
formaldehyde 50-00-0	Gallium arsenide 1303-00-0	Hexachlorodibenz 19408-74-3	Lithium carbonate 554-13-2	methyl carbamate 598-55-0	Methyl isocyanate 624-83-9	Nickel sulphate 7786-81-4	nitrobenzene 98-95-3	Nitrofurazone 59-87-0	n-Nitrosodimethyl 62-75-9
<b>ID:31</b> 	<b>ID:32</b> 	<b>ID:33</b> 	<b>ID:34</b> 	<b>ID:35</b> 	<b>ID:36</b> 	<b>ID:37</b> 	<b>ID:38</b> 	<b>ID:39</b> 	<b>ID:40</b> 
m-Nitrotoluene 99-08-1	p-Nitrotoluene 99-09-0	Orchloroxin A 303-47-9	Oxymetholone 434-07-1	pentachlorophen 87-86-5	Pentamidine iset 140-64-7	o-Phenylphenol 90-43-7	Phorbol myristat 16561-29-8	Ribavirin 36791-04-5	2,3,7,8-Tetrachlo 1746-01-6
<b>ID:41</b> 	<b>ID:42</b> 	<b>ID:43</b> 	<b>ID:44</b> 	<b>ID:45</b> 	<b>ID:46</b> 	<b>ID:47</b> 	<b>ID:48</b> 	<b>ID:49</b> 	
Tetraethyl lead 78-00-2	Tetrahydrocanni 1972-08-3	4,4-Thiobis(5-4-b 96-69-5	Toluene 108-88-3	Tris(2,3-dichloro 78-43-3	Vanadium pento 1314-62-1	4-Vinyl-1-cycloh 106-87-6	Indomethacin 53-86-1	Cyclophosphami 6055-19-2	

- ✦ AntibodyResponse
- ✦ NaturalKillerCells
- ✦ LymphocyteProliferation
- ✦ MixedLeukocyteResponse
- ✦ LeukocyteCount
- ✦ ThymusBodyWt
- ✦ SpleenBodyWt
- ✦ Lipopolysaccharide
- ✦ DelayedTypeHypersensitivity
- ✦ CytotoxicTLymphocyte
- ✦ SurfaceMarkers
- ✦ ContactSensitization
- ✦ HostResistanceAssays (6)



# FDAMDD: FDA's Center for Drug Evaluation & Research - Maximum (Recommended) Daily Dose Database

MRDD values for 1217 pharmaceuticals in mg/kg-body weight (bw)/day extracted from public literature sources (D. Benz, E. Matthews, N. Kruhlac, J. Contera)



# CPDBAS\_v3b\_1481

## STRUCTURE

DSSTox\_CID

DSSTox\_SID

DSSTox\_ID\_FileName

STRUCTURE\_Formula

STRUCTURE\_MolecularWeight

STRUCTURE\_ChemicalType

STRUCTURE\_TestForm

\_DefinedOrganic

STRUCTURE\_Shown

TestSubstance\_ChemicalName

TestSubstance\_CASRN

TestSubstance\_Description

ChemicalNote

STRUCTURE\_ChemicalName

\_IUPAC

STRUCTURE\_SMILES

STRUCTURE\_Parent\_SMILES

STRUCTURE\_InChI

StudyType

Endpoint

Species

SAL\_CPDB

TD50\_Rat\_mg/kg/day

TD50\_Rat\_mmol/kg/day

TargetSites\_Rat\_Male, Female, Both Sex

TD50\_Mouse\_mg/kg/day

TD50\_Mouse\_mmol/kg/day

TargetSites\_Mouse\_Male, Female, Both Sex

TD50\_Hamster\_mg/kg/day

TD50\_Hamster\_mmol/kg/day

TargetSites\_Hamster\_Male, Female, Both Sex

TD50\_Dog\_mg/kg/day

TargetSites\_Dog

TD50\_Rhesus\_mg/kg/day

TargetSites\_Rhesus

TD50\_Cynomolgus\_mg/kg/day

TargetSites\_Cynomolgus

**ActivityCategory\_SingleCellCall**

**ActivityCategory\_MultiCellCall**

ToxicityNote

NTP\_TechnicalReport

Website\_URL

adr = adrenal gland;

bon = bone;

cli = clitoral gland;

eso = esophagus;

ezy = ear/Zymbal's gland;

gal = gall bladder;

hag = harderian gland;

hmo = hematopoietic system;

kid = kidney;

lgi = large intestine;

liv = liver;

lun = lung;

meo = mesovarium;

mgl = mammary gland;

mix = mixture;

myc = myocardium;

nas = nasal cavity

nrv = nervous system;

orc = oral cavity

ova = ovary;

pan = pancreas;

per = peritoneal cavity;

pit = pituitary gland;

pre = preputial gland;

pro = prostate;

ski = skin;

smi = small intestine;

spl = spleen;

sto = stomach;

sub = subcutaneous tissue;

vag = vagina; ing animals;

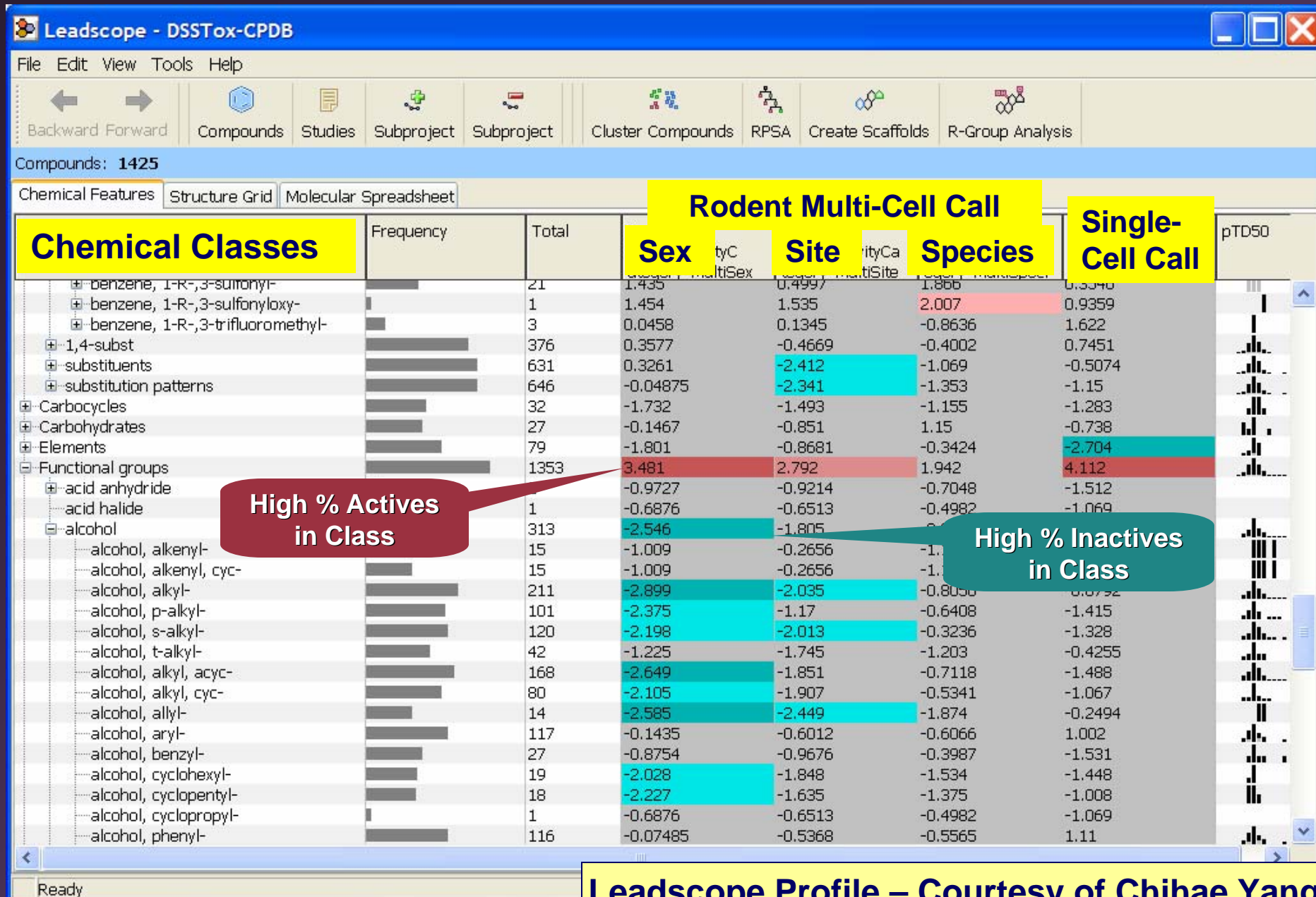
vsc = vascular system.

0

1

**multisite**  
**multisex**  
**multispecies**

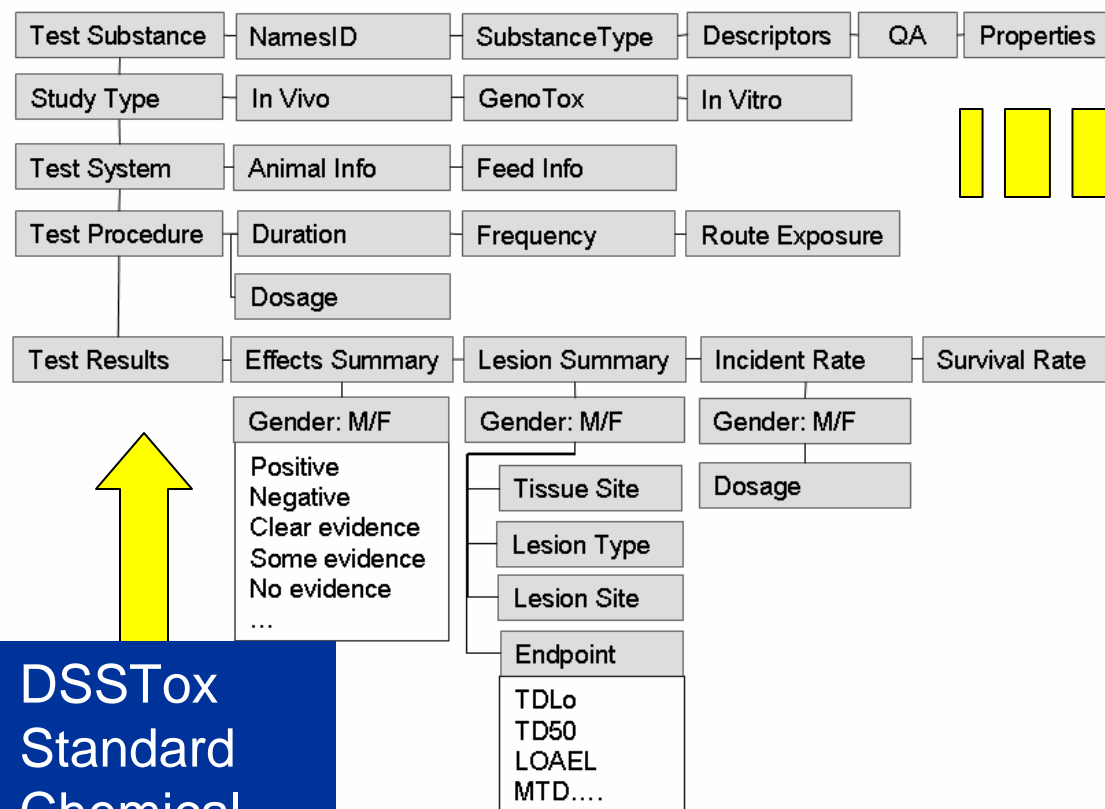
# Chemical-Biological Profiling of CPDBAS Activities



# Toxicity Experimental Data → Summary Data:

## Toxicity Content Model

ToxML



Intermediate  
toxicity  
classifications  
for SAR

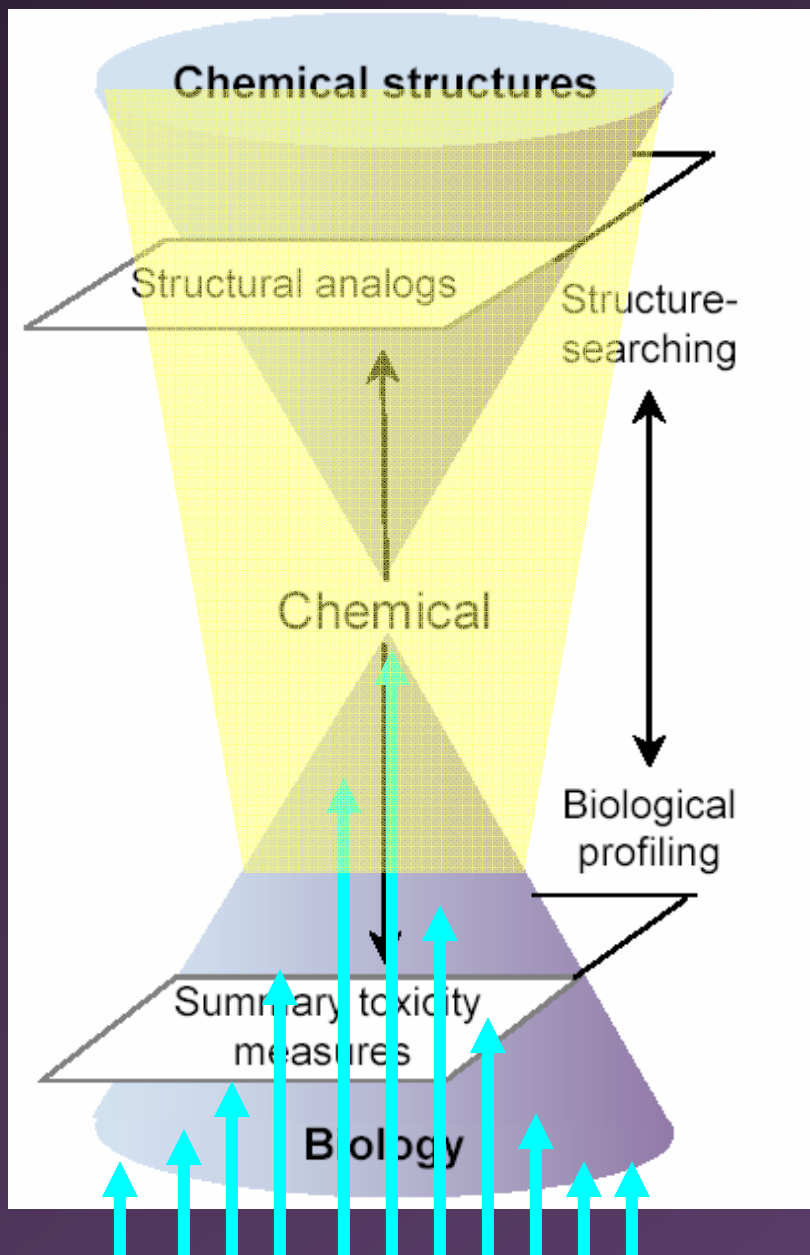


- ◆ Activity categories
- ◆ Potency categories
- ◆ Mode of action categories
- ◆ Summary calls

DSSTox  
Standard  
Chemical  
Fields



**DSSTox  
Summary  
Toxicity  
Data Files**



**Leadscope  
Data  
Mining**

**Leadscope  
QSAR  
Databases**

**ToxML**

# Chemical Errors in Toxicity Information:

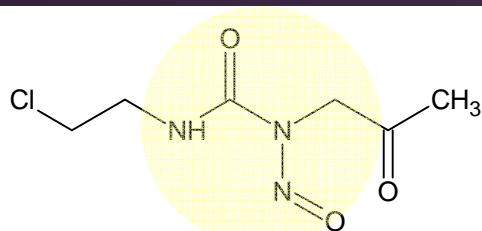
- ✦ Name is misspelled
- ✦ CAS is invalid or retired
- ✦ CAS and name do not agree
- ✦ Name and structure do not agree
- ✦ Name is insufficient for structure assignment
- ✦ Insufficient description of substance

# Carcinogenic Potency Database: *Hamster Carcinogenicity Results*

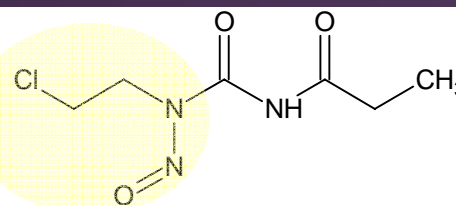
*From CPDB Hamster Table:*

N-Nitroso-oxopropylchloroethylurea

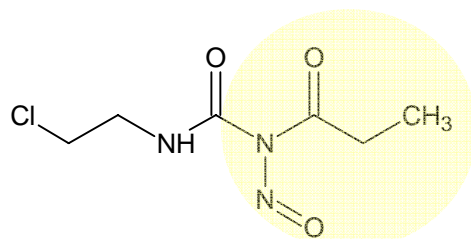
NOCAS



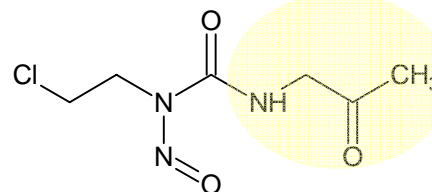
3-(2-chloroethyl)-1-nitroso-1-(2-oxopropyl)urea



*N*-[(2-chloroethyl)(nitroso)amino]carbonylpropanamide



*N*-[(2-chloroethyl)amino]carbonyl-*N*-nitrosopropanamide



1-(2-chloroethyl)-1-nitroso-3-(2-oxopropyl)urea

CPDB Hamster  
Carcinogenicity  
Data Reference



Rat Cancer  
Study  
(Materials)



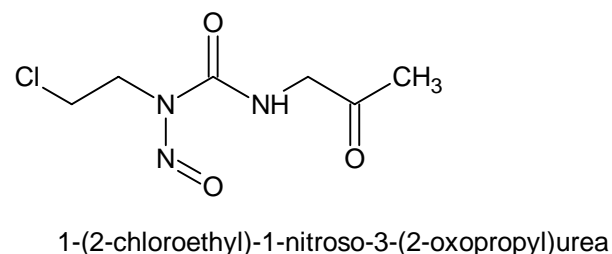
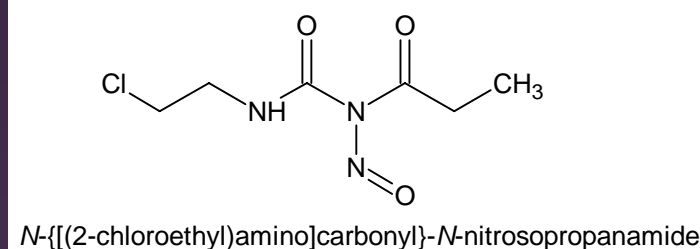
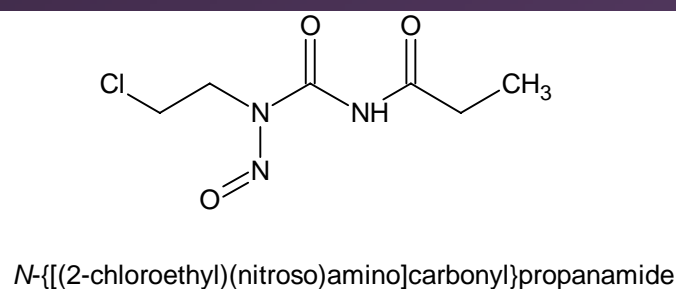
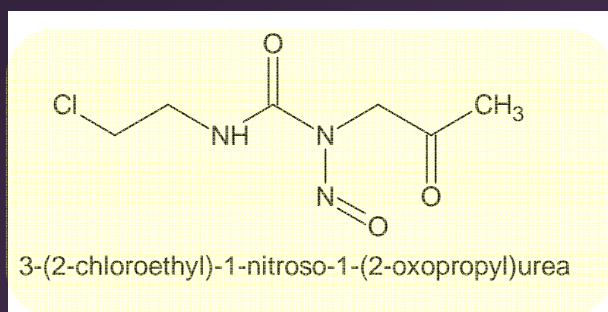
Chemical synthesis  
paper, NMR, IR  
structure confirmation

# Carcinogenic Potency Database: Hamster Carcinogenicity Results

From CPDB Hamster Table:

N-Nitroso-oxopropylchloroethylurea

NOCAS



Chemical  
synthesis paper,  
NMR, IR  
structure  
confirmation



IUPAC  
Name



CAS



Determined to be same chemical as:  
1-(2-Oxopropyl)nitroso-3-(2-chloroethyl)urea  
CAS [110559-85-8]  
Already listed in CPDB Rat and Mouse Table



# Perfluoroalkylacids (PFAAs):

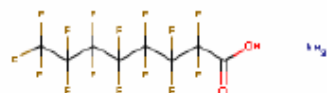
- ✦ Man-made, lipophilic, stable, biopersistent
- ✦ Widespread industrial use as surfactants (*stain and oil-resistant coatings, microwave popcorn bags, emulsifier, etc*)
- ✦ Widespread exposure environmental contamination
- ✦ PFOA (perfluorooctanoic acid ammonium salt) and PFOS (perfluorooctane sulfonic acid) of greatest concern to EPA
- ✦ PFOA and PFOS have undergone extensive toxicity testing
  - ✦ *Hepatotoxic*
  - ✦ *Developmental toxicants*
  - ✦ *Immunotoxic*



## ChemIDplus Lite Full Record

[Tox. & Env. Health](#) [TOXNET](#) [Return to Results Page](#)

Ammonium perfluorooctanoate  
RN: 3825-26-1



### Names and Synonyms

#### Synonyms

- [i](#) Ammonium pentadecafluorooctanoate
- [i](#) Ammonium perfluorocaprilate
- [i](#) Ammonium perfluorocaprylate
- [i](#) Ammonium perfluorooctanoate
- [i](#) EINECS 223-320-4
- [i](#) FC-143
- [i](#) Fluorad FC 143
- [i](#) NSC 35120
- [i](#) Pentadecafluoro-1-octanoic acid, ammonium salt
- [i](#) Perfluoroammonium octanoate
- [i](#) Perfluorooctanoic acid, ammonium salt

#### Systematic Name

- [i](#) Ammonium pentadecafluorooctanoate
- [i](#) Octanoic acid, pentadecafluoro-, ammonium salt

#### Superlist Name

- [i](#) Ammonium perfluorooctanoate

### Registry Numbers

#### CAS Registry Number

- [i](#) 3825-26-1

#### Other Registry Number

- [i](#) 77751-76-9
- [i](#) 95328-99-7

# PFOA

- ✦ Major synthetic pathway is telemerization
- ✦ Yields 98% pure linear form
- ✦ Verified by primary manufacturer (Dupont) and NMR



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SIS



## ChemIDplus Lite Full Record

[Tox. & Env. Health](#) [TOXNET](#) [Return to Results Page](#)

Potassium perfluorooctanesulfonate  
RN: 2795-39-3



# PFOS

### Names and Synonyms

#### Synonyms

- [1](#) 1,1,2,2,3,3,4,4,5,5,6,6,7,7,8,8,8-Heptadecafluoro-1-octanesulfonic acid, potassium salt
- [1](#) 1-Octanesulfonic acid, heptadecafluoro-, potassium salt
- [1](#) AI3-50950
- [1](#) EINECS 220-527-1
- [1](#) FC 95
- [1](#) Floral FC 95
- [1](#) Fluorad FC 95
- [1](#) Heptadecafluorooctanesulfonic acid, potassium salt
- [1](#) NSC 18405
- [1](#) Perfluorooctanesulfonic acid, potassium salt
- [1](#) Potassium PFOS
- [1](#) Potassium heptadecafluorooctane-1-sulfonate
- [1](#) Potassium perfluorooctanesulfonate

#### Systematic Name

- [1](#) 1-Octanesulfonic acid, 1,1,2,2,3,3,4,4,5,5,6,6,7,7,8,8,8-heptadecafluoro-, potassium salt
- [1](#) Potassium heptadecafluorooctane-1-sulphonate

### Registry Numbers

#### CAS Registry Number

- [1](#) 2795-39-3

#### Other Registry Number

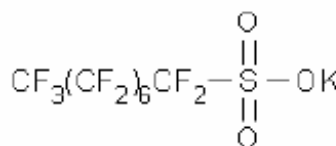
- [1](#) 117925-64-1
- [1](#) 59112-13-9
- [1](#) 62010-27-9
- [1](#) 69458-54-4

- ✦ Major synthetic pathway is electrochemical fluorination
- ✦ Yields approx 60-80% linear form, with significant non-linear contamination
- ✦ Verified by primary manufacturer (3M) and NMR

Product Name or No. ▼

## 77282 Heptadecafluorooctanesulfonic acid potassium salt

Fluka purum, ≥98.0% (T)



<b>Synonym</b>	Perfluorooctanesulfonic acid potassium salt Potassium heptadecafluoro-1-octanesulfonate
<b>Molecular Formula</b>	$\text{CF}_3(\text{CF}_2)_7\text{SO}_3\text{K}$
<b>Molecular Weight</b>	538.22
<b>CAS Number</b>	2795-39-3
<b>Beilstein Registry Number</b>	3864579
<b>EG/EC Number</b>	2205287
<b>MDL number</b>	MFCD00066407

[Expand/Collapse All](#)

### Price and Availability

Product Number	Your Price USD	Available to Ship	Quantity	Actions
77282-10G	62.70	02/22/2007 <a href="#">details...</a>	<input type="text"/>	
77282-50G	238.00	02/22/2007 <a href="#">details...</a>	<input type="text"/>	

### Properties

grade	purum
assay	≥98.0% (T)
mp	277-280 °C(lit.)

### Safety

Hazard Codes	<a href="#">Xn</a>
Risk Statements	<a href="#">22-36/37/38</a>
Safety Statements	<a href="#">26</a>
WGK Germany	3

### Related Categories

... [Sulfur Compounds](#) > [Sulfonic/Sulfinic Acids](#)

# PFOS

- ✦ Fluka is secondary chemical distributor
- ✦ Listed as 98.0% pure (T)
- ✦ (T) indicates titration method which confirms only empirical formula
- ✦ Listed as linear form by both structure and CASRN

Address <http://www.ncbi.nlm.nih.gov/entrez/query.fcgi>

NCBI PubChem BioAssay National Library of Medicine NLM

My NCBI [Sign In] [Register]

All Databases PubMed Nucleotide Protein Genome Structure PMC PubChem Books

Search PubChem BioAssay for dsstox Go Clear Save Search

Limits Preview/Index History

Display Summary

All: 5

Items 1 - 5 of 5

One page.

1: AID: [356](#)  
EPA Fathead Minnow Acute Toxicity database (EPAFHM)  
Source: EPA DSSTox  
14 Readouts, 617 substances tested

2: AID: [353](#)  
FDA Maximum Recommended Daily Dose (FDAMDD)  
Source: EPA DSSTox  
10 Readouts, 1216 substances tested

3: AID: [355](#)  
Water Disinfection By-Products with Pre  
Source: EPA DSSTox  
4 Readouts, 209 substances tested

4: AID: [354](#)  
NCTR Estrogen Receptor Binding Datab  
Source: EPA DSSTox  
13 Readouts, 232 substances tested

5: AID: [352](#)  
Carcinogenic Potency Database (CPDBA  
Source: EPA DSSTox  
27 Readouts, 1481 substances tested

Display Summary

PubChem Help | FAQ

PubChem Substance Structures supplied by depositors

PubChem Compound Unique structures with computed properties

PubChem BioAssay Bioactivity assay results supplied by depositors

PubChem Structure Search

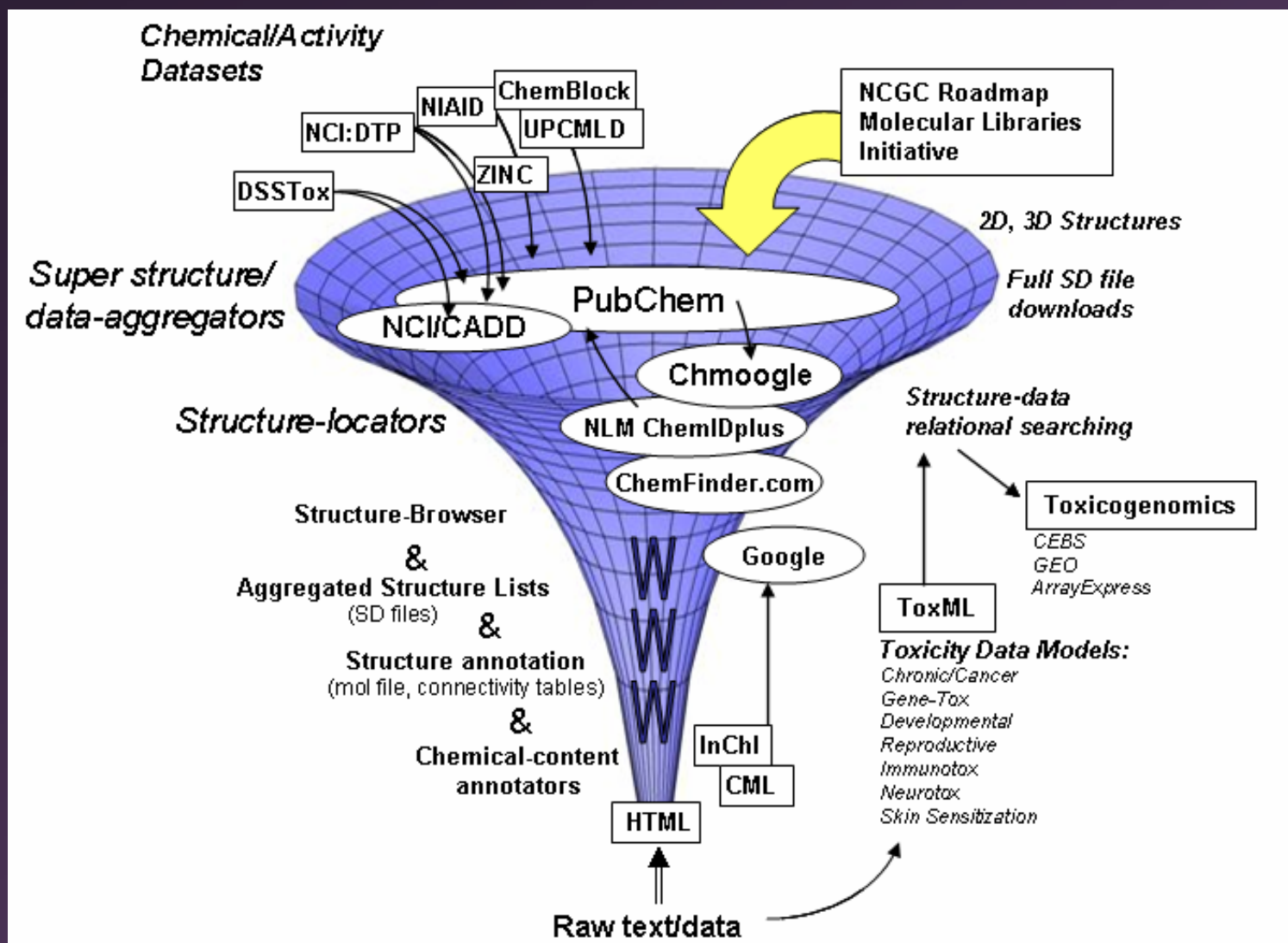
PubChem FTP

PubChem Substance Search: "dsstox" [sourcename]

- ◆ DSSTox databases
- ◆ Link to DSSTox website, docs
- ◆ Structure-searchable
- ◆ Links to ChemID Plus, PubMed
- ◆ Similar compounds
- ◆ Other bioassay data

NCBI | NLM | NIH

# Chemical Structure Searching of Biological Information on the Internet



Richard A.M., Gold, L.S., Nicklaus, M.C. (2006) Chemical structure indexing of toxicity data on the internet: Moving towards a flat world. *Curr. Opinion Drug Disc. Develop.*, 9(3): 314-325.



# Public Genomic Databases

The screenshot shows the NCBI Databases homepage. At the top, the NCBI logo is on the left, and the word "Databases" is in a large, stylized font. Below this is a navigation bar with links to PubMed, Entrez, BLAST, OMIM, Books, TaxBrowser, and Structure. A search bar is present with "Entrez" selected. On the left side, there is a sidebar with links to "NCBI Site Map", "Entrez Help", "Entrez Tutorial", "Entrez Global Query", "Entrez Tools", and "NCBI Handbook". The main content area features a description of Entrez as an integrated system. Overlaid on the right is the EMBL-EBI logo and a "Query for Experiments" form with fields for accession number, species, experiment type, experimental factors, author, laboratory, publication, array accession number, array design name, and array provider. At the bottom, a network diagram shows connections between various databases like Nucleotide, Gene, Books, Genome, Protein, UniSTS, HomoloGene, PubMed, Structure, OMIM, Journals, SNP, PMC, 3D Domains, and Conserved Domains, with a legend indicating the number of connections (10,000,000, 1,000,000, 100,000, 10,000).

NCBI Databases

PubMed Entrez BLAST OMIM Books TaxBrowser Structure

Search Entrez for

NCBI

Site Map  
Guide to NCBI resources

Entrez Help  
Help documentation for the Entrez system

Entrez Tutorial

Entrez Global Query  
Search a subset of Entrez databases

Entrez Tools  
Links to advanced Entrez tools such as Batch Entrez and E-Utilities

NCBI Handbook

Entrez is the integrated NCBI for the major Sequences, Proteins, and others. Click on the integration.

You are logged in as *guest* [Login »](#) **ArrayExpress** ( 717 Experiments with 21083 Hybs, 468 Arrays )

**Query for Experiments**

Give an experiment **accession number**  for example **E-MANP-2**,  
or fill out some of the following fields to get a list of matching experiments:

**Species**  
« any species »

**Experiment type**  
« any type »

**Experimental Factors**  
« any factor »

**Description contains the word**

**Author**

**Laboratory**

**Publication**  
« don't specify »

**Array accession number**

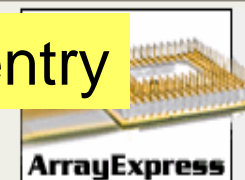
**Array design name**

**Array provider**

**Chemical Inventory**

**Chemical indexing**

**Linkages**



You are logged in as guest Login »

**ArrayExpress** ( 826 Experiments with 23633 Hybs, 543 Arrays )

Help

✦ How many experiments involve chemical exposures?

✦ How many unique chemicals are involved?

✦ Can one retrieve a listing of all chemicals?

✦ How is chemical exposure indexed?

### Query for Experiments

for example E-MANP-2,

Experiments:

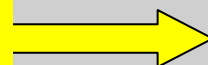
Author

Laboratory

Publication

« don't spe

Chemical name, CASRN



826 Experiments with 23633 Hybs, 543 Arrays

Array accession number

### Query fields:

- Accession number
- Species
- Experiment type
- Description contains the word
- Author
- Laboratory
- Publication
- Array accession number
- Array design name
- Array provider

### Query for Arrays

for example A-TIGR-32,

Give

or find out some of the following fields to get a list of matching arrays:

Array design name

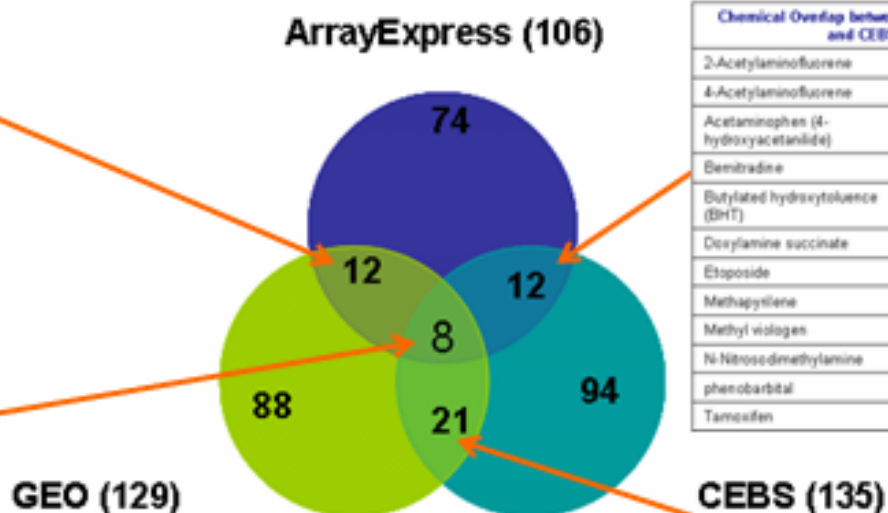
Array provider



Chemical Overlap Between ArrayExpress and GEO	
17beta-Estradiol	50-28-2
Genistein	446-72-0
Dexamethazone	50-02-2
Cycloheximide	66-81-9
Retinoic Acid	302-79-4
Hydrogen peroxide	7722-84-1
Terephthalic acid, TPA	100-21-0
Fenpropimorph	67306-03-0
5-Fluorouracil	51-21-8
Liothyronine	6893-02-3
Mitomycin C	50-07-7
Paclitaxel	33069-62-4

Chemical Overlap between ArrayExpress, GEO, and CEBS	
cis-Dichlorodiamine platinum	15663-27-1
Clofibrate	637-07-0
Clotrimazole	23593-75-1
Ethanol	64-17-5
Ethinyl estradiol	57-63-6
Lipopolysaccharide (LPS)	NOCAS
Miconazole	22916-47-8
Valproic acid	99-66-1

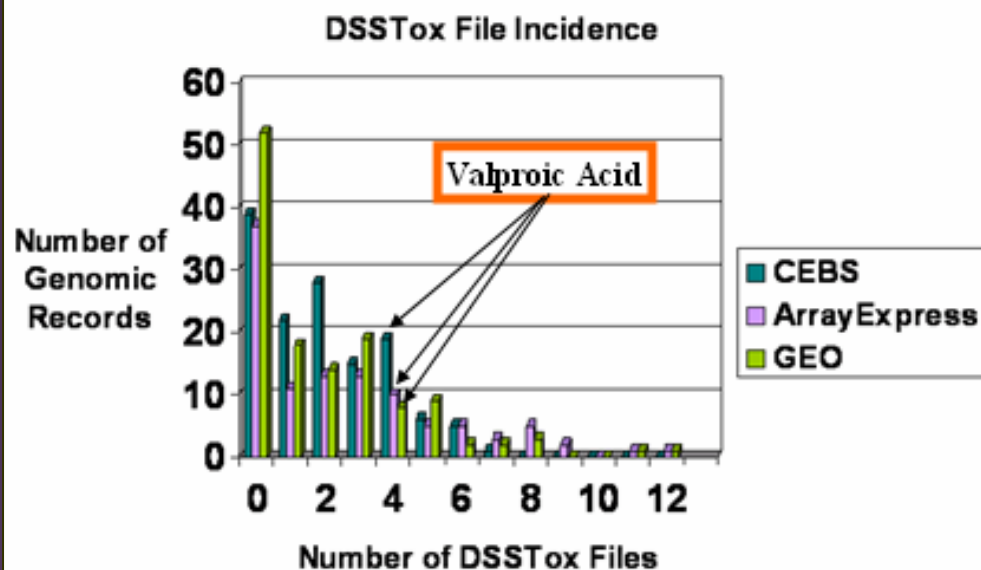
## Overlap between Genomic Repository Chemical Space



Chemical Overlap between ArrayExpress and CEBS	
2-Acetylaminofluorene	53-96-3
4-Acetylaminofluorene	28322-02-3
Acetaminophen (4-hydroxyacetanilide)	103-90-2
Bemtridine	86133-11-3
Butylated hydroxytoluene (BHT)	128-37-0
Oxylamine succinate	962-10-7
Etoposide	33419-42-0
Methapyllene	91-80-5
Methyl viologen	1910-42-5
N-Nitrosodimethylamine	62-75-9
phenobarbital	50-06-6
Tamoxifen	10540-29-1

Chemical Overlap between GEO and CEBS	
1,3-Bis(chloroethyl)-1-nitrosourea	154-93-8
Adriamycin, hydrochloride	25316-40-9
Allyl alcohol	107-18-6
alpha-Naphthyl isothiocyanate	551-06-4
Atorvastatin	134523-00-5
Bezafibrate	41859-67-0
Carbon tetrachloride	56-23-5
Dimethylformamide	68-12-2
Econazole	27220-47-9
Fenofibrate	49562-28-9
Fluconazole	86386-73-4
Fluvastatin	93957-54-1
Gemfibrozil	25812-30-0
Itraconazole	84625-61-6
Lovastatin	75330-75-5
Methotrexate	59-05-2
N-Nitrosodiethylamine	55-18-5
Rifampicin	13292-46-1
SMVASTATIN	79902-63-9
Sodium arsenite	7784-46-5
Troglitazone	97322-87-7

## Overlap between Genomic Chemical Space and DSSTox Chemical Space



# Part IV.

Expanded view of  
“Chemical analogs”

# Predictive Toxicology

**SAR Predictions  
based solely on  
chemical  
structures &  
properties**



**Toxicity  
predictions  
based on HTS  
or gene  
expression  
profiles,  
*eg Gene-Logic***

# Chemical “Probes” of biological systems:

*“We find that the connection between structure and biological response is not symmetric, with biological response better at predicting chemical structure than vice versa.”*

*D. Covell and coworkers  
NCI Developmental Therapeutics Program  
J Chem Inf Model (2006) 46:430-437*

# Biological spectra analysis: Linking biological activity profiles to molecular structure

PNAS January 11, 2005 vol. 102 no. 2 261–266

Anton F. Fliri\*, William T. Loging, Peter F. Thadeio, and Robert A. Volkmann\*†

CHEMISTRY PHARMACOLOGY

Pfizer Global Research and Development, Groton, CT 06340

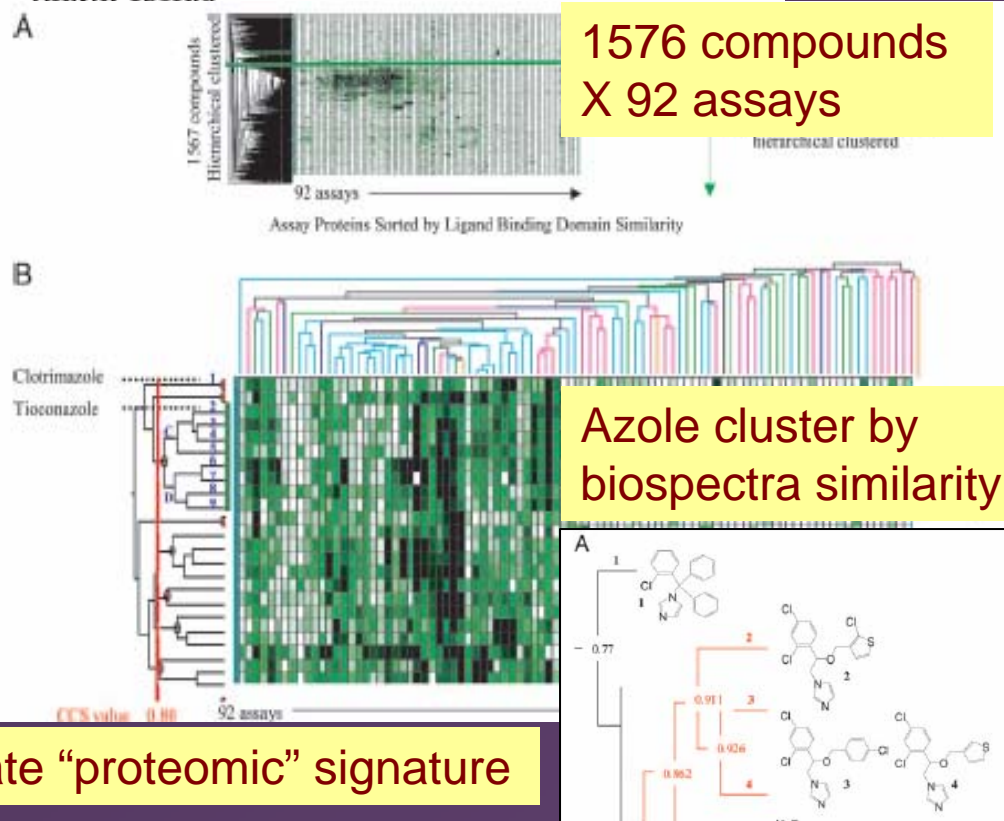
Communicated by Larry E. Overman, University of California, Irvine, CA, October 25, 2004 (received for review September 4, 2004)

Establishing quantitative relationships between molecular structure and broad biological effects has been a longstanding challenge in science. Currently, no method exists for forecasting broad biological activity profiles of medicinal agents even within narrow boundaries of structurally similar molecules. Starting from the premise that biological activity results from the capacity of small organic molecules to modulate the activity of the proteome, we set out to investigate whether descriptor sets could be developed for measuring and quantifying this molecular property. Using a 1,567-compound database, we show that percent inhibition values, determined at single high drug concentration in a battery of *in vitro* assays representing a cross section of the proteome, provide precise molecular property descriptors that identify the structure of molecules. When broad biological activity of molecules is represented in spectra form, organic molecules can be sorted by quantifying differences between biological spectra. Unlike traditional structure–activity relationship methods, sorting of molecules by using biospectra comparisons does not require knowledge of a molecule's putative drug targets. To illustrate this finding, we selected as starting point the biological activity spectra of clotrimazole and tioconazole because their putative target, lanosterol demethylase (CYP51), was not included in the bioassay array. Spectra similarity obtained through profile similarity measurements and hierarchical clustering provided an unbiased means for establishing quantitative relationships between chemical structures and biological activity spectra. This methodology, which we have termed biological spectra analysis, provides the capability not only of sorting molecules on the basis of biospectra similarity but also of predicting simultaneous interactions of new molecules with multiple proteins.

biospectra | proteome | structure–function relationships

differences in biological environments (8). Considering the complexity of this requirement, computational solutions that precisely link molecular structure to broad biological response are currently not possible (9, 10). We report here an approach to structure–function studies that is based on measurements of the capacity of molecules to interact with the proteome (11).

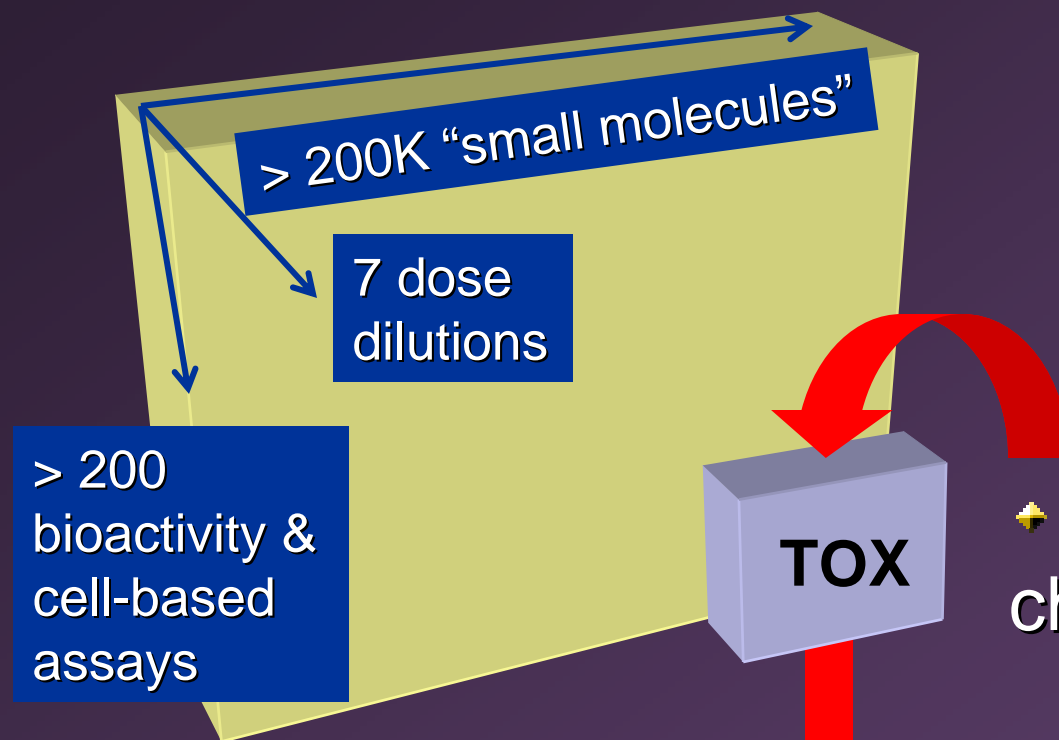
## Translation of Chemical Property Information into Biological Activity Spectra



Approximate “proteomic” signature

# NIH/NCGC Roadmap: [nihroadmap.nih.gov](http://nihroadmap.nih.gov)

## Small Molecules High-Throughput Screening Initiative

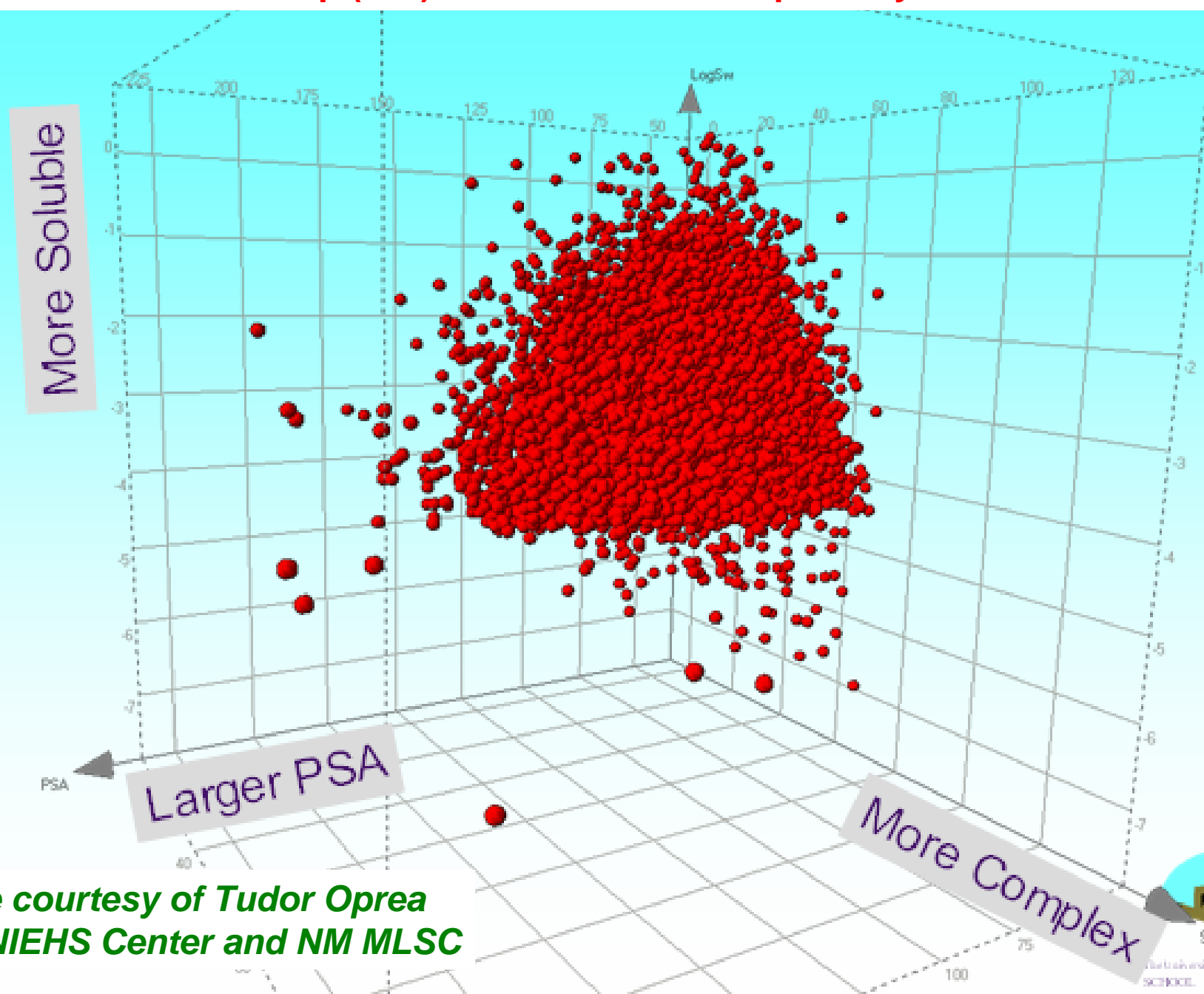


✦ Reference dataset of toxicity-related chemicals with structures & bioactivity profiles

✦ Sample "toxicity" chemical space:

- ✦ NTP chemicals
- ✦ EPA pesticides
- ✦ DSSTox
- ✦ NCI/ChemNavigator

## NIH Molecular Roadmap (DPI) Small Molecules Repository: 65225 chemicals

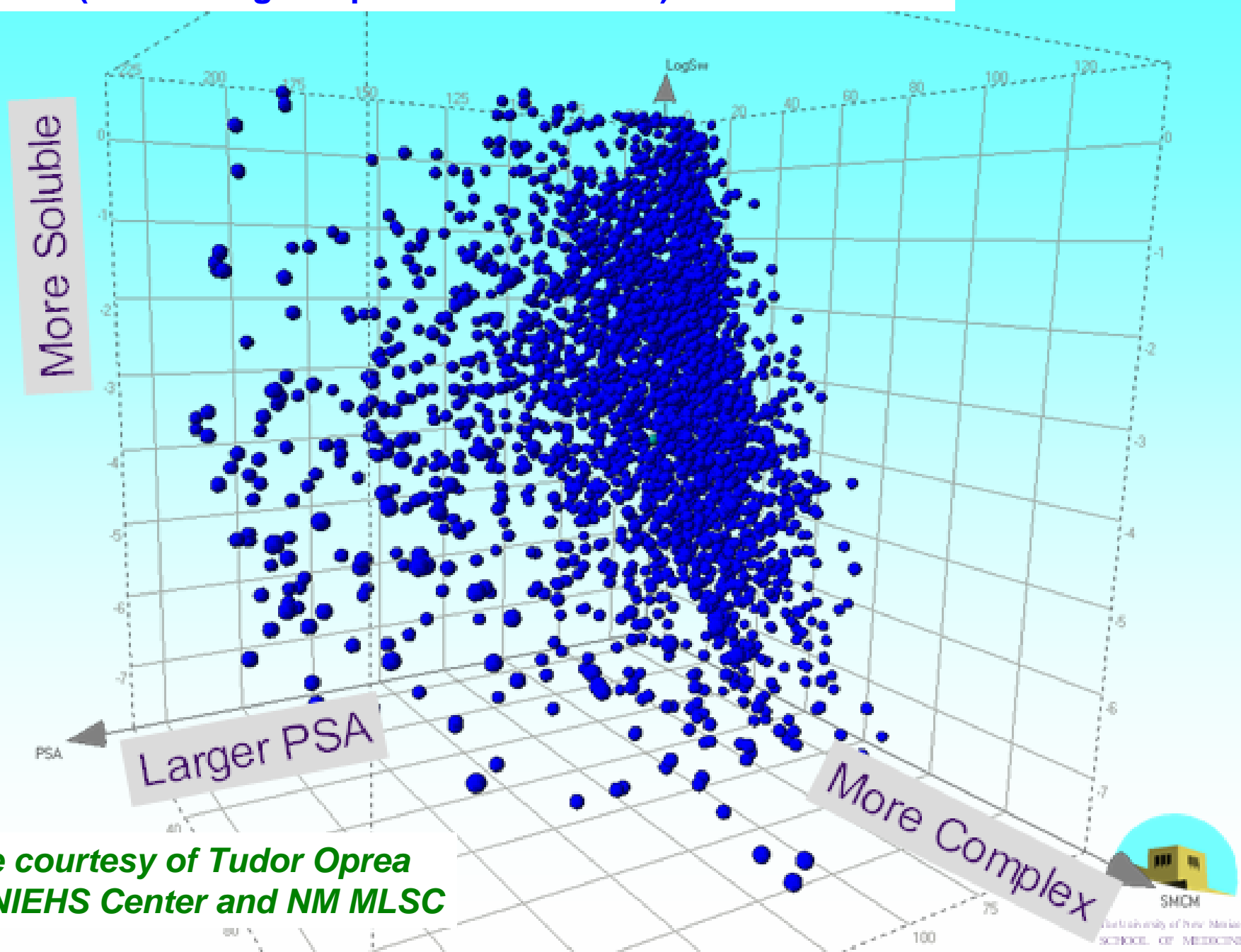


*Slide courtesy of Tudor Oprea  
NM NIEHS Center and NM MLSC*



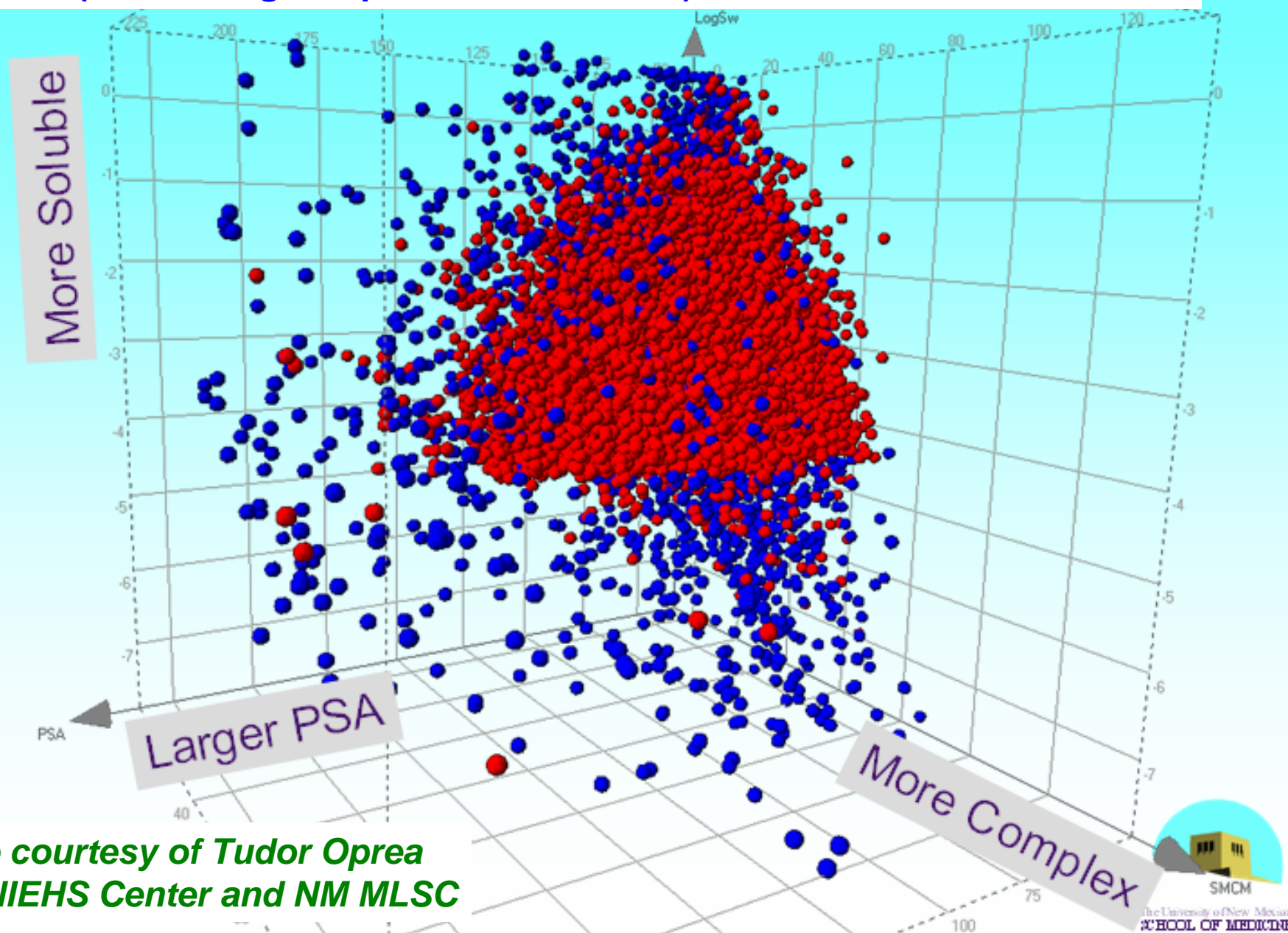


## DSSTox (defined organic parent - v1a Master): 5499 chemicals





**NIH Molecular Roadmap (DPI) Small Molecules Repository: 65225 chemicals**  
**DSSTox (defined organic parent - v1a Master): 5499 chemicals**

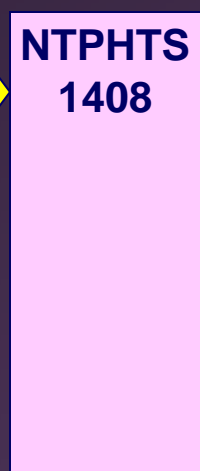


*Slide courtesy of Tudor Oprea  
NM NIEHS Center and NM MLSC*



# NTP High-Throughput Testing Program in Collaboration with NCGC

DSSTox SDF Files



Search Substance:  
"dsstox [sourcename]  
AND ntphts"

*20 HTS bioassays  
15 dose dilutions  
IC50s*



# NTPHTS\_NCGC Assay Results (1408)

- CellTiter-Glo luminescent assay for cell viability
- 4 human cell lines representing common tissue toxicities:

*Liver: HepG2 (human hepatocellular carcinoma)*

*Blood: Jurkat (Clone E6-1, human T cell leukemia)*

*Kidney: HEK293 (human embryonic kidney cells)*

*Nerve: SK-N-SH (human neuroblastoma)*

- 2 human primary cell lines:

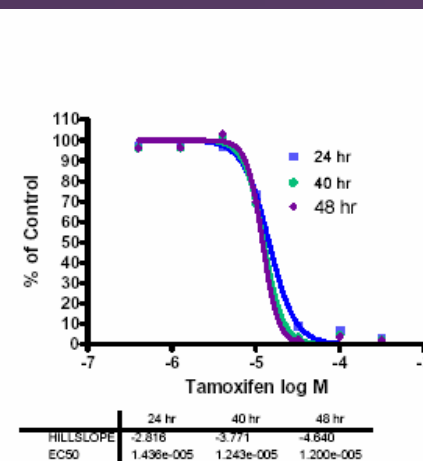
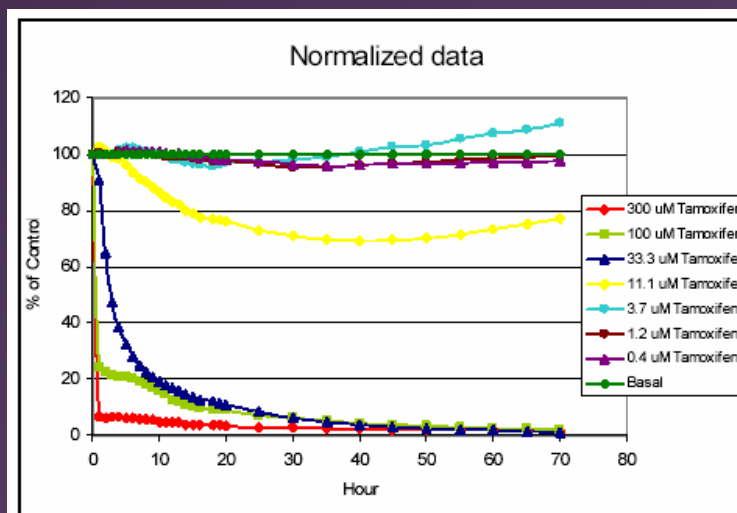
*Human lung fibroblasts: MRC-5*

*Human foreskin fibroblasts: BJ*

- Compound profile in HepG2 cells

*Time Course for  
Tamoxifen  
in HepG2 Cells*

*Courtesy of  
Chris Austin, NCGC*



# BioAssay Results

BioAssay ID (AID): 360



Source: NCGC

Name: Glucocerebrosidase

Source: "dsstox" AND "ntphts"

Total 48125 compounds found (48125 unique), 20 displayed: [Next](#) page

AC50, Hill Coefficient

Structure	PubChem		Outcome	Activity Score	Submitter	Submission Date	Activity Direction	Activity Qualifier	Qualified AC50	Log of AC50	Hill Coefficient	Curve R2	Data Type	Compound Type
	SID	CID												
	4243169	3237927	Active	72	ncgc	19 Jan 2006	decreasing	=	6.06e-008	-7.22	0.87	1	qHTS	NIHSMR
	4264637	2210290	Active	71	ncgc	19 Jan 2006	decreasing	=	7e-008	-7.16	0.66	1	qHTS	NIHSMR

## Full Concentration Response Curve

Compound QC	Curve Fit Model	Hill S0	Hill Sinf	Hill dS	Log AC50 Std Error	Curve Chi2f	Excluded Points	Number of Points	Activity at 4.925nM (%)	Activity at 24.623nM (%)	Activity at 0.123uM (%)	Activity at 0.615uM (%)	Activity at 3.077uM (%)	Activity at 15.386uM (%)	Activity at 0.077mM (%)
QC'd by DPI	4pHill (AC50,n,S0,Sinf)	-1.23	-100.1	98.92	0.02	0.5	0	7	-11.3	-31.9	-65.8	-88.4	-96.4	-99.6	-100.2
QC'd by DPI	4pHill (AC50,n,S0,Sinf)	11.41	-107.2	118.6	0.1	2.04	0	7	-5.5	-30.2	-56.9	-84.4	-100	-103.7	-105

# EPA ToxCast Program



- ✦ HTS screening of 300-400 pesticide actives in > 100 selected bioassays; 1408 total compounds for NCGC screening

*bioactivity*

*cell/tissue-based*

*high content assays (e.g. c elegans)*

- ✦ ToxRefDB - High quality reference data for registered pesticides

*create relational database (tailor ToxML schema)*

*extract data from EPA Registered Pesticide DERs*

- ✦ DSSTox structure annotation, overlaps with toxicity databases, chemical selection criteria

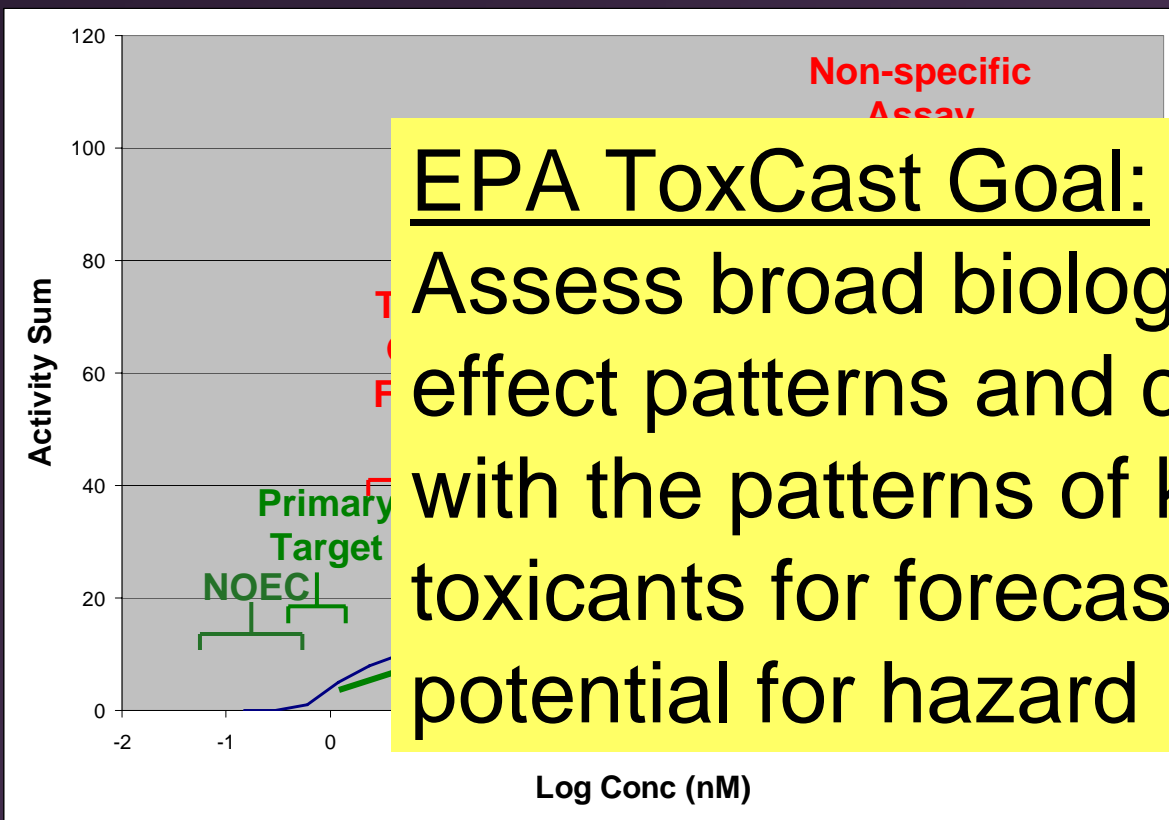
- ✦ ACToR integrated data warehouse & analysis system to support prediction modeling efforts

# Assay Coverage – Key Mechanisms / Toxicities

- ✦ Cell cycle, apoptosis, DNA recombination and repair
  - ✦ Transporters, channels, membrane receptors
  - ✦ Signal transduction pathways
  - ✦ Nuclear receptor mediated pathways
  - ✦ Oxidative Stress
- 
- ✦ Genotoxic and non-genotoxic carcinogenicity
  - ✦ Developmental and reproductive toxicity
  - ✦ Developmental neurotoxicity and immunotoxicity

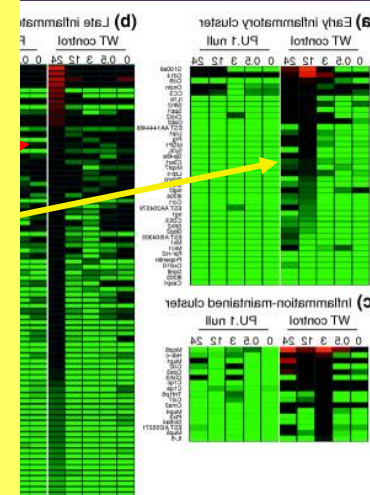


# Bioactivity Profiling of Pharmaceuticals vs Environmental Chemicals



EPA ToxCast Goal:  
Assess broad biological effect patterns and correlate with the patterns of known toxicants for forecasting potential for hazard

HTS Target Panels

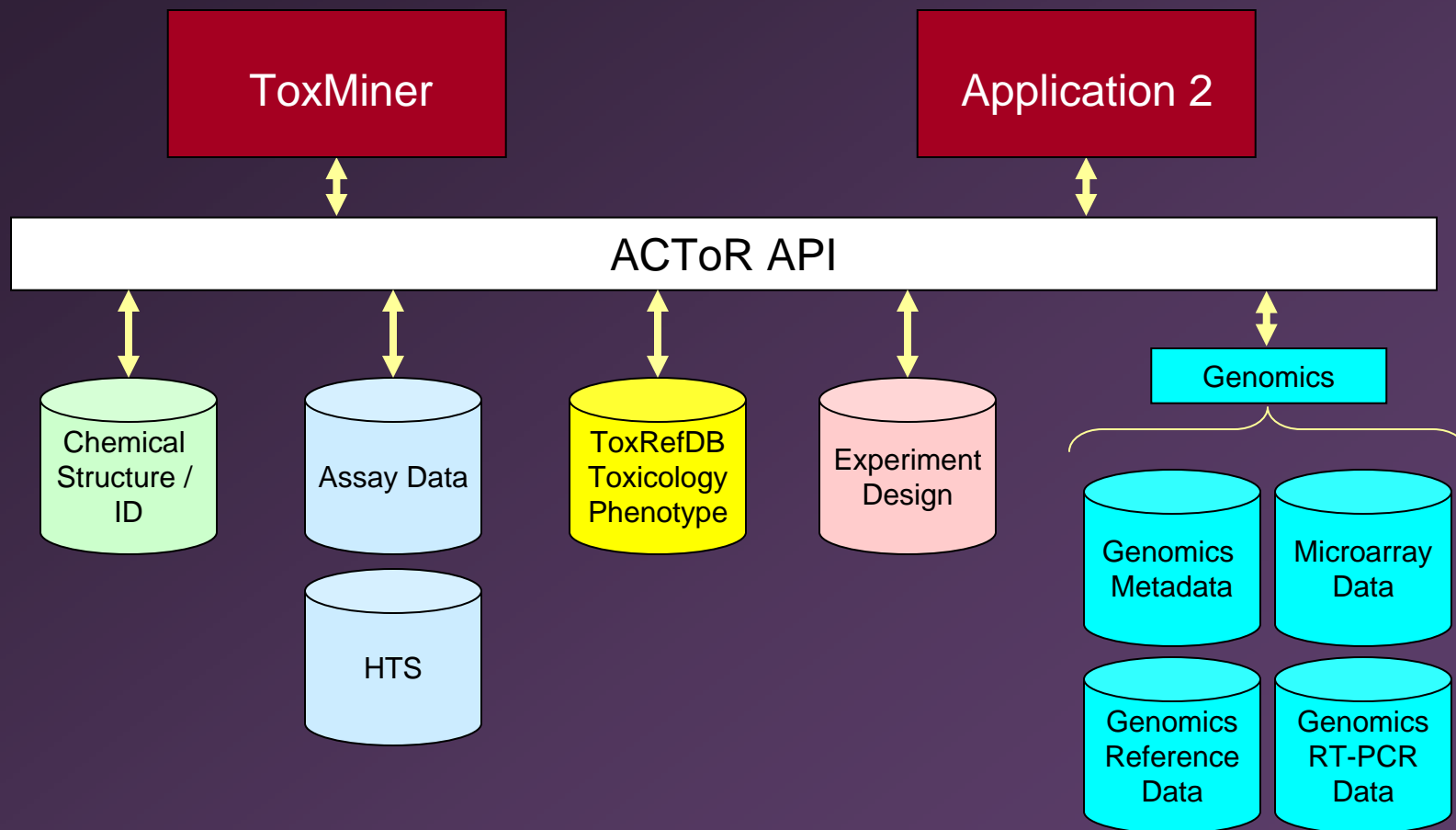


Heat map profiles of activity in different assays (columns) arranged by compound (rows). Inactive (green) to highly active (red).



# ACToR

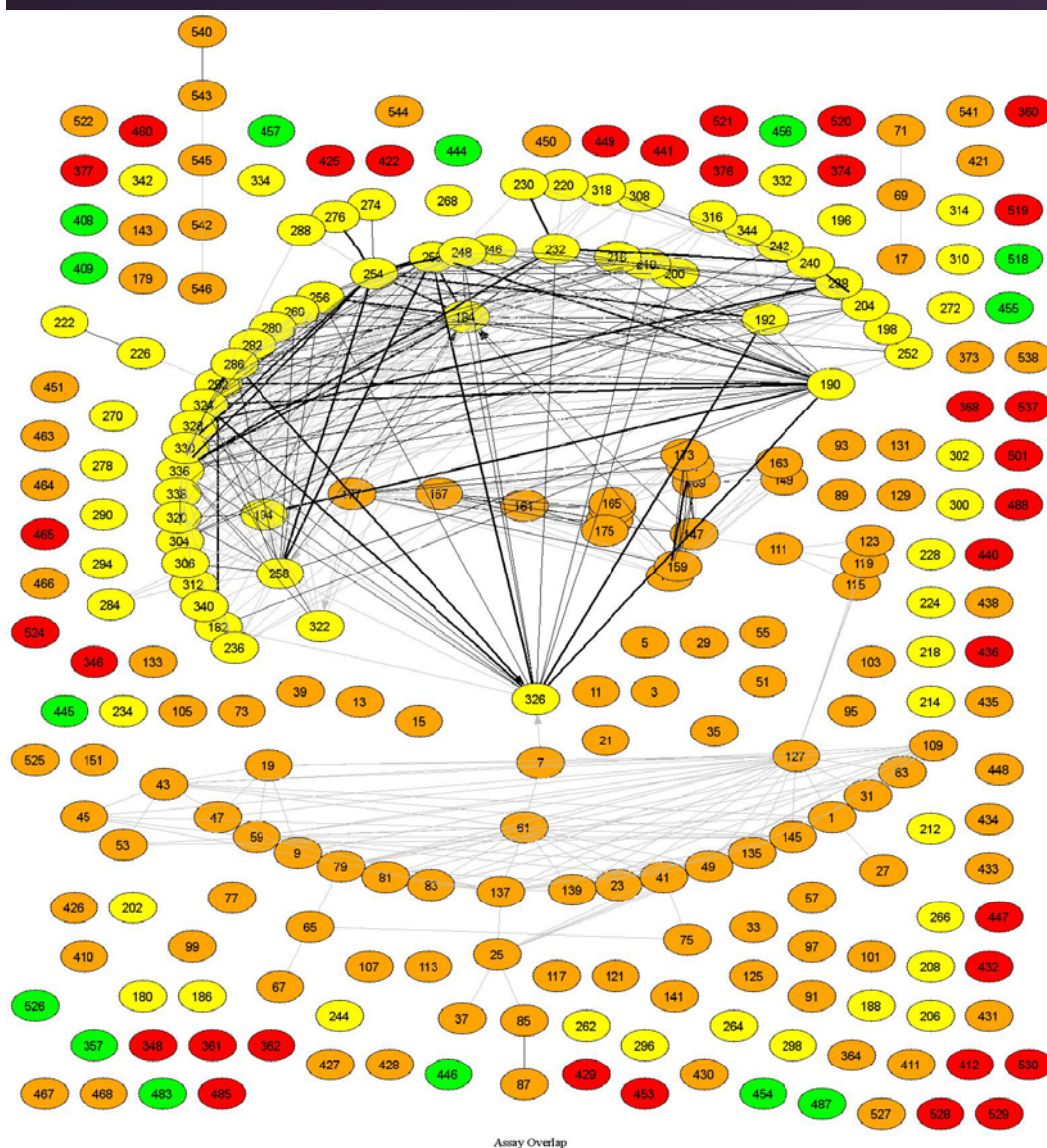
## Aggregated Computational Toxicology Resource



*Courtesy of Dr. Richard Judson, EPA National Center for Computational Toxicology*



# Example Correlation Map From PubChem (NIH)



252 assays from diverse sources

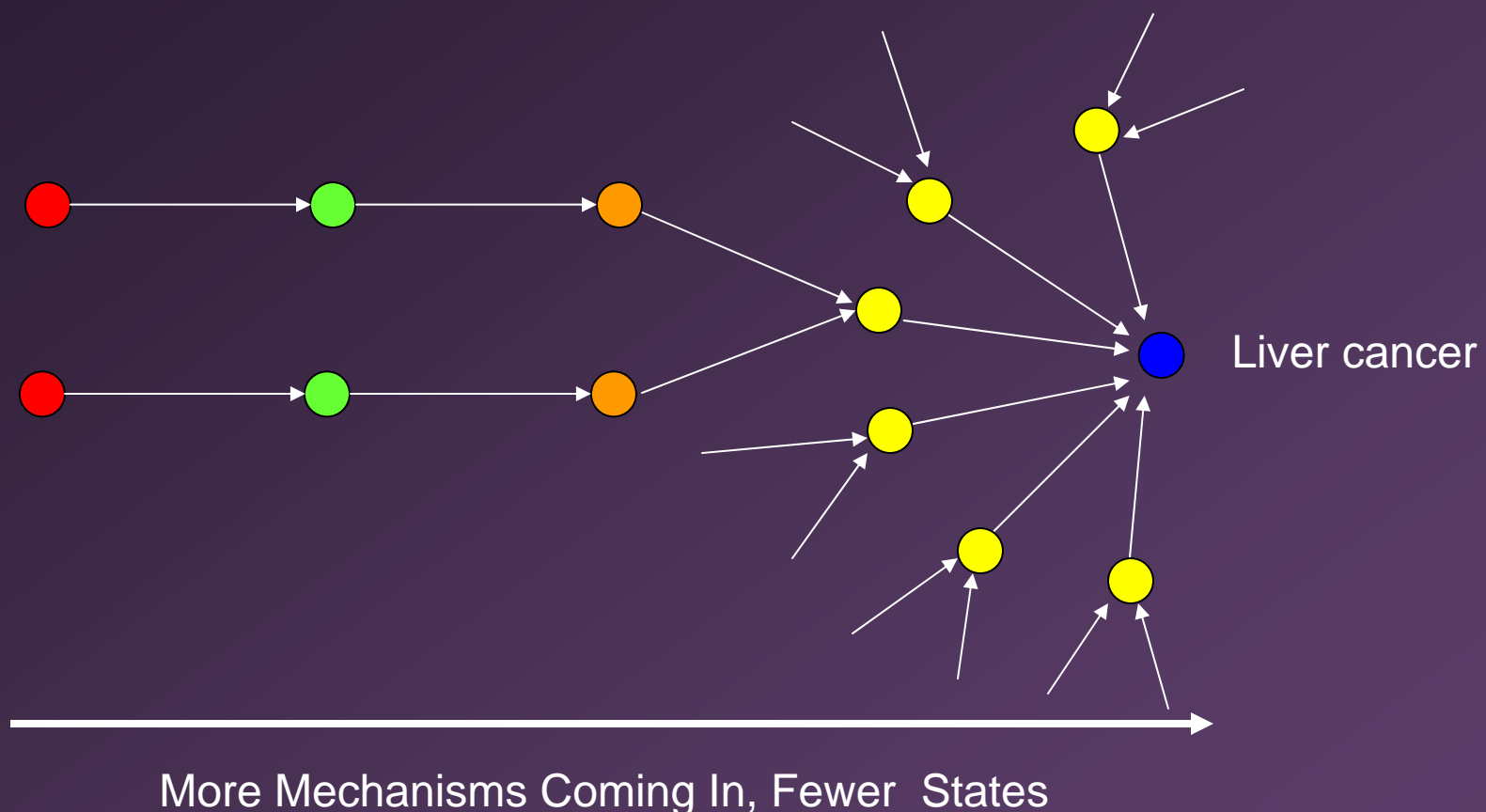
Line represent strong correlation from results of common chemicals

ToxCast will far exceed PubChem in number of assays spanning a common set of chemicals

- Direct Molecular Interaction
- Molecular Pathway
- Cellular Process
- Tissue/Organ Effect
- Organism Endpoint

*Courtesy of Dr. Richard Judson, EPA National Center for Computational Toxicology*

# Predictive Power Increases as We Move Upstream



*Courtesy of Dr. Richard Judson, EPA  
National Center for Computational Toxicology*

- Direct Molecular Interaction
- Molecular Pathway
- Cellular Process
- Tissue/Organ Effect
- Organism Endpoint

# EPA ToxCast

## ToxRefDB - Toxicity Reference Database:

Source:	EPA's Office of Pesticide Programs (OPP)
Format:	Data Evaluation Record (DER)
Chemical:	Conventional Pesticide Active Ingredients (~800)
Purity:	Technical Grade (>90%)
Dosing:	Primarily Orally Administered (based on availability and use pattern of pesticide)
Study Type:	Subchronic Toxicity (Rodents and Non-Rodents)
	Prenatal Developmental Toxicity
	Reproduction and Fertility Effects (2-generation)
	Chronic Toxicity (rat, mouse, and dog)
	Carcinogenicity (rat and mouse)
	Developmental Neurotoxicity
	Immunotoxicity

### Targeted Toxicological Data Collection

#### \*\*\*Data Collection Results\*\*\*

> 4000 DER (2500 studies)  
for over 400 pesticides

#### Toxicological Schema and Lexicon Development

- ToxML compatibility and interoperability
- Standardized fields and vocabulary
  - Study Type (OPPTS/OECD Test Guidelines)
  - Data Usability (Data Quality) Code
  - Animal Info (Species, Strain, Sex Category)
  - Treatment Group Category (Adult, Offspring, etc.)
  - Endpoint Category (Systemic, Maternal, etc.)
  - Effect Descriptors (Type, Target, and Description Vocabulary)

*Courtesy of Matt Martin, EPA National Center for Computational Toxicology*

# EPA ToxCast Toxicity Reference Database

Toxicological Reference Database - Study Input Form																																																																																																																															
<b>Data Entry Completeness Score</b> Partially Complete (Effect Data)			 <b>ToxRefDB</b> <b>Input Form</b>			 <small>UNITED STATES ENVIRONMENTAL PROTECTION AGENCY</small> <small>COMPUTATIONAL TOXICOLOGY</small>																																																																																																																									
<b>Historic Study Identifiers</b> <b>MRID#</b> <input type="text" value="00149582"/> <b>Primary Study Year</b> <input type="text" value="1986"/> Supplemental MRID/Historic ID(s) <input type="text" value="MRID 00165247"/>			<b>Study/Data Quality</b> <b>Data Usability</b> <input type="text" value="Acceptable Guideline (pre-1998)"/> Study-Level Comments <input type="text" value="Statistically significant clin chem results, but were not tabularized"/>			<b>Test Material Information</b> <span style="float: right;"><input type="button" value="Search Chemical List"/></span> <b>Chemical</b> <input type="text" value="Myclobutanil"/> <b>Purity (%)</b> <input type="text" value="90.4"/> Lot/Batch# <input type="text" value="LAP 0298"/> Source <input type="text"/> Test Material (Chemical) Comments <input type="text"/>																																																																																																																									
<b>Study Type</b> <b>Study Type</b> <input type="text" value="Combined chronic toxicity/carcinogenicity"/>			<b>Animal and Dose Information</b> <b>Species</b> <input type="text" value="rat"/> <b>Method/Route of Administration</b> <input type="text"/> Strain <input type="text" value="Sprague Dawley"/> Feed <input type="text"/>  Animal and Dose Administration Comments (Including Not In List) <input type="text" value="91.4% for 83159-7 (weeks 16 on)"/>																																																																																																																												
<b>Study Duration</b> <b>Start</b> <input type="text" value="0"/> day Additional Study Duration Information <b>Finish</b> <input type="text" value="2"/> year																																																																																																																															
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<div style="display: flex; justify-content: space-between;"> <div style="width: 30%;"> <p>Upload Form Info Use Excel upload form to add treatment groups. Click "Bulk Upload"; Copy and paste into form and upload groups.</p> <p><a href="#">Excel Treatment Group Form</a></p> <p><input type="button" value="Bulk Upload"/></p> <p><input type="button" value="Update List"/></p> </div> <div style="width: 60%;"> <table border="1" style="width: 100%; border-collapse: collapse; font-size: small;"> <thead> <tr> <th colspan="9" style="background-color: #e0e0ff;">Treatment Group List</th> <th style="background-color: #0056b3; color: white;">View or Add Effect Data by Type</th> </tr> <tr> <th>Treatment Group Category</th> <th>Gender Category</th> <th>Dose Period Type</th> <th colspan="2">Dose</th> <th colspan="2">Duration</th> <th># / Goup</th> <th></th> </tr> </thead> <tbody> <tr><td>Adult (P1)</td><td>M</td><td>Initial-to-Terminal</td><td>2.49</td><td>mg/kg/day</td><td>24</td><td>month</td><td>52</td><td><input type="text"/></td></tr> <tr><td>Adult (P1)</td><td>F</td><td>Initial-to-Terminal</td><td>3.23</td><td>mg/kg/day</td><td>24</td><td>month</td><td>60</td><td><input type="text"/></td></tr> <tr><td>Adult (P1)</td><td>M</td><td>Initial-to-Terminal</td><td>9.84</td><td>mg/kg/day</td><td>24</td><td>month</td><td>52</td><td><input type="text"/></td></tr> <tr><td>Adult (P1)</td><td>F</td><td>Initial-to-Terminal</td><td>12.86</td><td>mg/kg/day</td><td>24</td><td>month</td><td>60</td><td><input type="text"/></td></tr> <tr><td>Adult (P1)</td><td>M</td><td>Initial-to-Terminal</td><td>39.21</td><td>mg/kg/day</td><td>24</td><td>month</td><td>52</td><td>pathology (Neoplastic)</td></tr> <tr><td>Adult (P1)</td><td>F</td><td>Initial-to-Terminal</td><td>52.34</td><td>mg/kg/day</td><td>24</td><td>month</td><td>60</td><td>Pathology (Neoplastic)</td></tr> <tr><td>Adult (P1)</td><td>M</td><td>Interim Sacrifice</td><td>2.49</td><td>mg/kg/day</td><td>17</td><td>month</td><td>18</td><td>Pathology (Non-neoplastic)</td></tr> <tr><td>Adult (P1)</td><td>F</td><td>Interim Sacrifice</td><td>3.23</td><td>mg/kg/day</td><td>17</td><td>month</td><td>10</td><td>Reproductive</td></tr> <tr><td>Adult (P1)</td><td>M</td><td>Interim Sacrifice</td><td>9.84</td><td>mg/kg/day</td><td>17</td><td>month</td><td>18</td><td>Urinalysis</td></tr> <tr><td>Adult (P1)</td><td>F</td><td>Interim Sacrifice</td><td>12.86</td><td>mg/kg/day</td><td>17</td><td>month</td><td>10</td><td></td></tr> <tr><td>Adult (P1)</td><td>M</td><td>Interim Sacrifice</td><td>39.21</td><td>mg/kg/day</td><td>17</td><td>month</td><td>18</td><td></td></tr> </tbody> </table> <div style="margin-top: 5px;"> <input type="button" value="Delete Selected Treatment Group"/> <input type="button" value="Search Effect Vocabulary"/> <input type="button" value="Toggle to Critical Effects Form"/> </div> </div> </div>										Treatment Group List									View or Add Effect Data by Type	Treatment Group Category	Gender Category	Dose Period Type	Dose		Duration		# / Goup		Adult (P1)	M	Initial-to-Terminal	2.49	mg/kg/day	24	month	52	<input type="text"/>	Adult (P1)	F	Initial-to-Terminal	3.23	mg/kg/day	24	month	60	<input type="text"/>	Adult (P1)	M	Initial-to-Terminal	9.84	mg/kg/day	24	month	52	<input type="text"/>	Adult (P1)	F	Initial-to-Terminal	12.86	mg/kg/day	24	month	60	<input type="text"/>	Adult (P1)	M	Initial-to-Terminal	39.21	mg/kg/day	24	month	52	pathology (Neoplastic)	Adult (P1)	F	Initial-to-Terminal	52.34	mg/kg/day	24	month	60	Pathology (Neoplastic)	Adult (P1)	M	Interim Sacrifice	2.49	mg/kg/day	17	month	18	Pathology (Non-neoplastic)	Adult (P1)	F	Interim Sacrifice	3.23	mg/kg/day	17	month	10	Reproductive	Adult (P1)	M	Interim Sacrifice	9.84	mg/kg/day	17	month	18	Urinalysis	Adult (P1)	F	Interim Sacrifice	12.86	mg/kg/day	17	month	10		Adult (P1)	M	Interim Sacrifice	39.21	mg/kg/day	17	month	18	
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# ToxCast Toxicity Reference Database

Summary of 53 Chronic/Cancer Rat/Mouse Studies Entered into ToxRefDB			
Total Effects Entered		1452	
Unique Effects		317	
Effect Type		Endpoint Summary	
Body Weight	166	Studies achieve LOAEL	40
Organ Weight	205	Endpoint Dose Range (mg/kg/day)	
Clinical Chemistry	85	<=10	9
Hematology	116	>10 and <=100	20
Non-neoplastic Pathology	333	>100 and <=1000	10
Clinical Signs	66	>1000	1
Effect Target		Effects at Dose Range (mg/kg/day)	
Liver	298	<=10	274
Kidney	70	>10 and <=100	536
Testes	49	>100 and <=1000	561
Thyroid Gland	14	>1000	49

*Courtesy of Matt Martin, EPA National Center for Computational Toxicology*

# Chemical Structures

The diagram is a cross-section of a house with a black roof and light-colored walls. The roof is labeled 'Chemical Structures' in a green box. The house is divided into four main rooms: STUDY, BEDROOM, KITCHEN, and UTILITY ROOM. Each room has a corresponding label in a red box: 'Cancer' for the STUDY, 'Repro & Develop Tox' for the BEDROOM, 'Genetox' for the KITCHEN, and 'Neurotox' for the UTILITY ROOM. To the left of the house, a yellow box labeled 'Chronic whole animal studies' points to the STUDY. To the right, a yellow box labeled 'Cell-based assays' points to the UTILITY ROOM. The ground level is represented by a brick pattern and is labeled with three yellow boxes: 'Bioactivity' (under the KITCHEN), 'Protein expression' (under the UTILITY ROOM), and 'Gene expression' (under the UTILITY ROOM). A small label '9' ceiling' is located between the STUDY and BEDROOM. Another label 'cabinet above fridge' is located between the KITCHEN and UTILITY ROOM. Human figures are shown in the STUDY, KITCHEN, and UTILITY ROOM.

Chronic  
whole  
animal  
studies

Cancer

STUDY

Repro &  
Develop Tox

BEDROOM

Genetox

KITCHEN

Neurotox

UTILITY  
ROOM

Cell-based  
assays

Bioactivity

Protein expression

Gene expression



# Chemical Structures

Chronic whole animal studies

Cancer

Repro & Develop Tox

Genetox

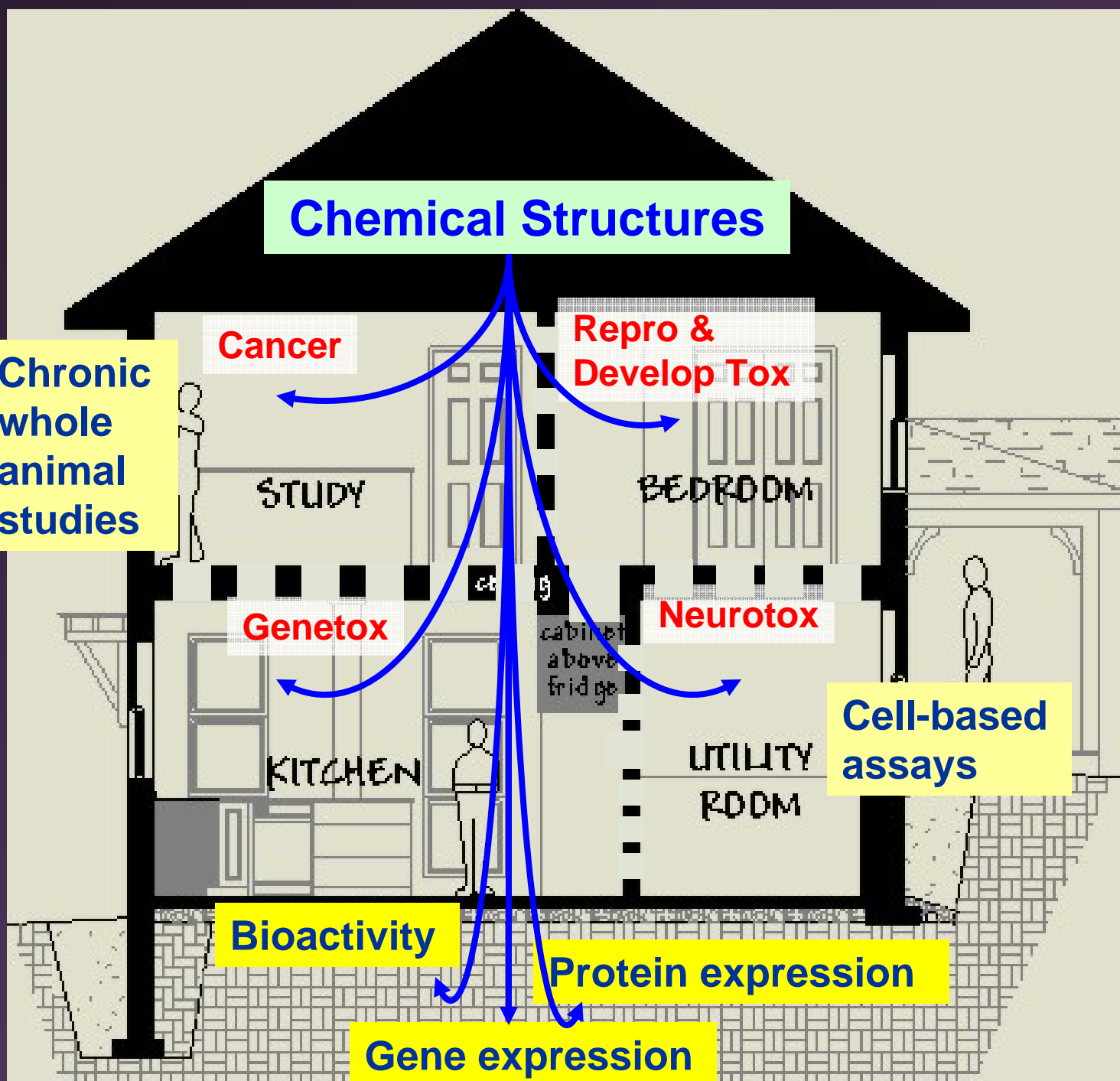
Neurotox

Cell-based assays

Bioactivity

Protein expression

Gene expression



# Acknowledgments

- ✦ Maritja Wolf, Jamie Burch, ClarLynda Williams – EPA/NCCT/DSSTox
- ✦ Ray Tice, Cynthia Smith, Beth Bowden, Brad Collins – NIEHS/NTP
- ✦ Robert Kavlock (Director, NCCT), David Dix (ToxRefDB, HTS, Genomics), Keith Houck (HTS), Matt Martin (ToxRefDB), Richard Judson (ACToR) – EPA/NCCT/ToxCast
- ✦ Chihae Yang – Leadscope
- ✦ Steve Bryant, Jane Tseng, Yanli Wang – PubChem Project
- ✦ Lois Gold – Carcinogenic Potency Project
- ✦ Tudor Oprea – Univ. of New Mexico, School of Medicine
- ✦ Chris Austin, Ajit Jadhav (NIH/NCGC); Doug Livingston (DPI-SMR)