

# Data Integration: A Case Study

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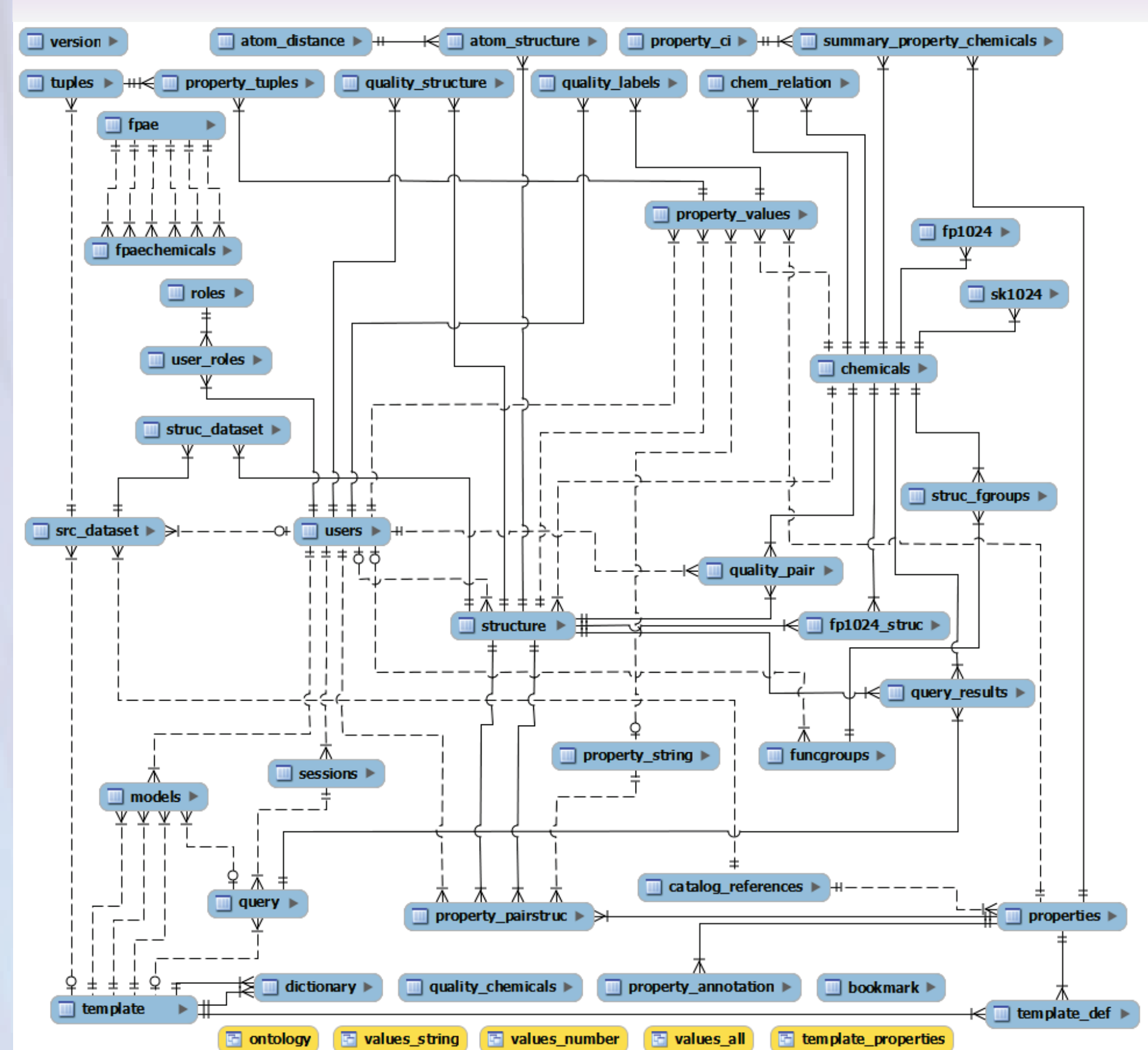
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## Introduction

An important pre-requisite for the successful implementation of the main principles of the 3Rs - Reduction, Refinement and Replacement alternatives - is the universal access to high quality experimental data on various chemical properties. Unfortunately, even today, the "state-of-the-art" is characterised by highly fragmented and unconnected life sciences data (both from a physical and ontological perspective), which is furthermore frequently inaccurate and/or difficult or even impossible to find or access. We present an AMBIT web services-based case study of integration and comparison of 67 datasets with physico-chemical and/or experimental toxicity data, originating from various public and commercial sources. The datasets can be retrieved as a whole or by submission of search queries on chemical identifiers, properties, structures, sub-structures or similarity. The content from different datasets can be easily collated, thanks to the universal database structure design and the ontology that establishes a shared terminology and meaning of the data fields. Additionally, the datasets are "model-ready", and can be used as an input to OpenTox compliant predictive models. Query and submission of new data or data modifications can be carried out through the web services interface, which implements the OpenTox framework API.

Chemical structures (including ECHA's list of pre-registered substances<sup>1</sup>) have been collected from various public sources and/or generated by name to structure conversion<sup>2</sup>. In this process inconsistencies between chemical structures have been discovered and flagged automatically through built-in heuristics. We report the overlap between the datasets in terms of number of common compounds, as well as mutual similarity or coverage of the "chemical domain", calculated by structure-based and descriptor based methods. Several computational resources and predictive methods are seamlessly integrated by the uniform OpenTox application programming interface. The similarity between a user supplied set of chemicals and the existing datasets can be conveniently accessed online, either programmatically or via a web browser.

## AMBIT Database



The AMBIT database is a relational database, consisting of several repositories for compounds, properties, QSAR models, roles, references, as well as several tables containing pre-processed information which allows speeding up substructure and similarity queries. The current implementation is based on MySQL<sup>3</sup>. An overview of the entity-relationship diagram of the database is provided in the above figure.

## Datasets Included in this Study

Dataset Name	Number of Compounds	Uniform Resource Identifier (URI)
ECHA list of pre-registered substances	143835	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/1?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/1?pagesize=10&amp;page=0</a>
Chemical Identifier Resolver <sup>4</sup>	72985	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5?pagesize=10&amp;page=0</a>
ChemDplus <sup>5</sup>	80468	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3?pagesize=10&amp;page=0</a>
ChemDraw <sup>6</sup>	22519	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/7?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/7?pagesize=10&amp;page=0</a>
ECBPRS <sup>7</sup>	80410	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6483?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6483?pagesize=10&amp;page=0</a>
ISSCAN <sup>8</sup>	1150	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/31?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/31?pagesize=10&amp;page=0</a>
ISSMIC	151	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/33?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/33?pagesize=10&amp;page=0</a>
ISSSTY	223	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/35?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/35?pagesize=10&amp;page=0</a>
CPDBAS <sup>9</sup>	1547	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/9?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/9?pagesize=10&amp;page=0</a>
DBPCAN	209	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/11?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/11?pagesize=10&amp;page=0</a>
EPAFHM	617	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/13?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/13?pagesize=10&amp;page=0</a>
FDAMDD	1216	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/15?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/15?pagesize=10&amp;page=0</a>
HPVCSI	3548	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/17?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/17?pagesize=10&amp;page=0</a>
HPVISD	1006	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/19?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/19?pagesize=10&amp;page=0</a>
IRISTR	544	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/21?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/21?pagesize=10&amp;page=0</a>
KIERBL	278	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/23?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/23?pagesize=10&amp;page=0</a>
NCTREX	232	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/25?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/25?pagesize=10&amp;page=0</a>
NTPBSI	2330	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/27?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/27?pagesize=10&amp;page=0</a>
NTPHTS	1408	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/29?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/29?pagesize=10&amp;page=0</a>
TOXCST <sup>10</sup>	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/37?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/37?pagesize=10&amp;page=0</a>
TOXCST_ACEA	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/83?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/83?pagesize=10&amp;page=0</a>
TOXCST_Attagene	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/723?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/723?pagesize=10&amp;page=0</a>
TOXCST_BioSeek	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/4563?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/4563?pagesize=10&amp;page=0</a>
TOXCST_Cellumen	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/2003?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/2003?pagesize=10&amp;page=0</a>
TOXCST_CelzDirect	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/2643?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/2643?pagesize=10&amp;page=0</a>
TOXCST_Gentronix	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3283?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3283?pagesize=10&amp;page=0</a>
TOXCST_NCGC	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3923?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/3923?pagesize=10&amp;page=0</a>
TOXCST_Novascreeen	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/4563?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/4563?pagesize=10&amp;page=0</a>
TOXCST_Solidus	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5203?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5203?pagesize=10&amp;page=0</a>
TOXCST_ToxRefDB	320	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5843?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/5843?pagesize=10&amp;page=0</a>
TXCST2	960	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/39?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/39?pagesize=10&amp;page=0</a>
ECETOC Technical Report No. 66 Skin irritation and corrosion Reference Chemicals data base (1995)	176	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/41?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/41?pagesize=10&amp;page=0</a>
Local Lymph Node Data for the Evaluation of Skin Sensitization - Compilation of historical data (2005)	209	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/43?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/43?pagesize=10&amp;page=0</a>
Local Lymph Node Data for the Evaluation of Skin Sensitization - Second compilation (2010)	108	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/45?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/45?pagesize=10&amp;page=0</a>
Bioconcentration factor (BCF) Gold Standard Database	1130	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/47?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/47?pagesize=10&amp;page=0</a>
Benchmark Data Set for pKa Prediction of Monoprotic Small Molecules the SMARTS Way	185	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/49?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/49?pagesize=10&amp;page=0</a>
Benchmark Data Set for In Silico Prediction of Ames Mutagenicity	6197	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/51?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/51?pagesize=10&amp;page=0</a>
Bursi AMES Toxicity Dataset	4337	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/53?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/53?pagesize=10&amp;page=0</a>
EPI_AOP <sup>11</sup>	818	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/55?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/55?pagesize=10&amp;page=0</a>
EPI_BCF	685	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/57?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/57?pagesize=10&amp;page=0</a>
EPI_BioHC	175	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/59?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/59?pagesize=10&amp;page=0</a>
EPI_Biowin	1263	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/61?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/61?pagesize=10&amp;page=0</a>
EPI_Boil_Pt	5890	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/63?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/63?pagesize=10&amp;page=0</a>
EPI_Henry	1829	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/65?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/65?pagesize=10&amp;page=0</a>
EPI_KM	631	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/67?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/67?pagesize=10&amp;page=0</a>
EPI_KOA	308	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/69?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/69?pagesize=10&amp;page=0</a>
EPI_Kowwin	15809	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/71?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/71?pagesize=10&amp;page=0</a>
EPI_Melt_Pt	10051	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/73?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/73?pagesize=10&amp;page=0</a>
EPI_PCKOC	788	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/75?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/75?pagesize=10&amp;page=0</a>
EPI_VP	3037	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/77?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/77?pagesize=10&amp;page=0</a>
EPI_WaterFrag	5764	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/79?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/79?pagesize=10&amp;page=0</a>
EPI_Wskowwin	2348	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/81?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/81?pagesize=10&amp;page=0</a>
NAME2STRUCTURE (OPSIN)	70646	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/648?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/648?pagesize=10&amp;page=0</a>
PubChem Structures + Assays <sup>12</sup>	473965	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6489?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6489?pagesize=10&amp;page=0</a>
Leadscope_carc_level_2*	2988	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6490?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6490?pagesize=10&amp;page=0</a>
Leadscope_ccris_genetox*	8001	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6492?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6492?pagesize=10&amp;page=0</a>
Leadscope_cder_chronic*	121	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6494?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6494?pagesize=10&amp;page=0</a>
Leadscope_cder_genetox*	336	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6496?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6496?pagesize=10&amp;page=0</a>
Leadscope_cder_repro_dev*	58	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6498?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6498?pagesize=10&amp;page=0</a>
Leadscope_cfsan_acute*	1070	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6500?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6500?pagesize=10&amp;page=0</a>
Leadscope_cfsan_chronic*	655	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6502?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6502?pagesize=10&amp;page=0</a>
Leadscope_cfsan_genetox*	696	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6504?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6504?pagesize=10&amp;page=0</a>
Leadscope_cfsan_repro_dev*	312	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6506?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6506?pagesize=10&amp;page=0</a>
Leadscope_fda_marketed_drugs*	6637	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6508?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6508?pagesize=10&amp;page=0</a>
Leadscope_genetox_level_2*	10155	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6510?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6510?pagesize=10&amp;page=0</a>
Leadscope_ntp_genetox*	2128	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6512?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6512?pagesize=10&amp;page=0</a>
Pharmatropae_AERS_hepatobiliary_system*	1274	<a href="https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6514?pagesize=10&amp;page=0">https://ambit.uni-plovdiv.bg:8443/ambit2/dataset/6514?pagesize=10&amp;page=0</a>

(\* datasets accessible solely to OpenTox partners, due to restrictions imposed by the corresponding license agreements)

## Results and Discussion

The overlap between datasets with experimental data and ECHA's list of pre-registered substances is in the range from 0.01% to 5.2% of ECHA's entries. The EPI datasets with physicochemical properties have the largest overlap with ECHA's list (Melting point 5.2%, Boiling point 3.4%, Kow 3.2%), followed by PubChem (4.3%), commercial Leadscope genetox datasets (2.3-2.84%) and various carcinogenicity and mutagenicity datasets (0.4-1.7%). The overlap of ToxCast phase I data is as small as 0.2% of ECHA's entries. Interestingly, from the 473965 PubChem structures with associated assay data, used in this study, only 1.3% (6198) are part of ECHA's list of pre-registered substances. Data compilation and fusion, combined with the OpenTox web service API, enables flexible automated retrieval and collation of properties for a given query compound.

<sup>1</sup> ECHA's list of pre-registered substances <http://apps.echa.europa.eu/preregistered/prsDownload.aspx>

<sup>2</sup> Chemical Name to Structure: OPSIN, an Open Source Solution Daniel M. Lowe, Peter T. Corbett, Peter Murray-Rust, Robert C. Glen *Journal of Chemical Information and Modeling* 2011 51 (3), 739-753

<sup>3</sup> MySQL <http://www.mysql.com/>

<sup>4</sup> Chemical Identifier Resolver <http://cactus.nci.nih.gov/chemical/structure>

<sup>5</sup> ChemDplus <http://chem.sis.nlm.nih.gov/chemidplus/>

<sup>6</sup> ChemDraw <http://www.cambridgesoft.com/software/ChemDraw>

<sup>7</sup> Ex-European Chemicals Bureau pre-registered substances list

<sup>8</sup> ISSTOX Chemical Toxicity Databases <http://www.iss.it/meca/dati/cont.php?id=199&lang=1&tipo=25>

<sup>9</sup> DSSTox <http://www.epa.gov/nceet/dsstox/index.html>

<sup>10</sup> ToxCast <http://www.epa.gov/nceet/toxcast/>

<sup>11</sup> EPI Suite data <http://esc.syrres.com/Interkow/EPISuiteData.htm>

<sup>12</sup> Downloadable Structure Files of PubChem Compounds <http://cactus.nci.nih.gov/download/roadmap/>

[www.OpenTox.org](http://www.OpenTox.org)



OpenTox - An Open Source Predictive Toxicology Framework, funded under the EU Seventh Framework Program: HEALTH-2007-1.3-3 Promotion, development, validation, acceptance and implementation of QSARs (Quantitative Structure-Activity Relationships) for toxicology, Project Reference Number Health-F5-2008-200787 (2008-2011).

