HelmholtzZentrum münchen German Research Center for Environmental Health



Web Tools for Predictive Toxicology Model Building

Igor V. Tetko Helmholtz Zentrum Muenchen & eADMET GmbH

OpenTox, Munich, August 11, 2011

Web tools – why?

The widest possible dissemination of information Instant sharing of data and models Data integration from different partners Private/shared/public access to data and models Access to original sources of data Collaboration to develop common models Sharing of developed models Reuse of knowledge and best modeling practices

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Highlighting web tools & resources

CDD LtD (Spin off Eli Lilly)2004 collaborativedrug.comVCCLAB (INTAS project)2005 vcclab.orgAMBIT (IDEA Ltd)2005 ambit.sourceforge.netOCHEM (GO-Bio project, eADMET GmbH)2011 ochem.euOpenTox (FP7 project)2010 opentox.orgCADASTER QSPR-THESAURUS (FP7 project)2009 cadaster.euJRC QMRF Database (JRC, EU)2008 qsardb.jrc.itChemBench (UNC, NIH & EPA)2010 chembench.mml.unc.edu

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Grouping by functionality

Database sharing

CDD LtD (Spin off Eli Lilly)

Descriptor calculation & modelling

VCCLAB (INTAS project)

Collection of descriptions and models

JRC QMRF Database (JRC, EU) CADASTER QSPR-THESAURUS (FP7 project)

Workflow and API for model development and publishing

ChemBench (UNC, NIH & EPA) OpenTox (FP7 project)

Database and workflow for model development and publishing

OCHEM (GO-Bio project, eADMET GmbH)

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DATA sharing: Collaborative Drug Discovery (CDD)





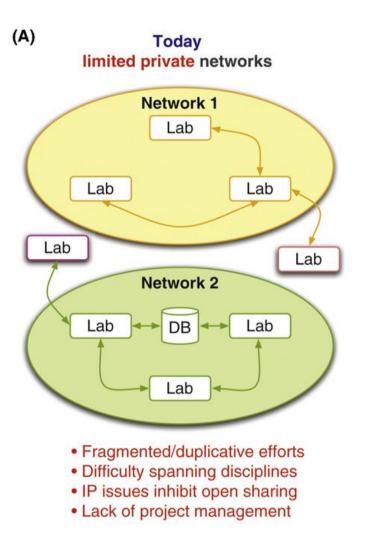
Collaborate securely with your partners

Not everyone wants to share data, but if you do, you retain full control over who can access which data

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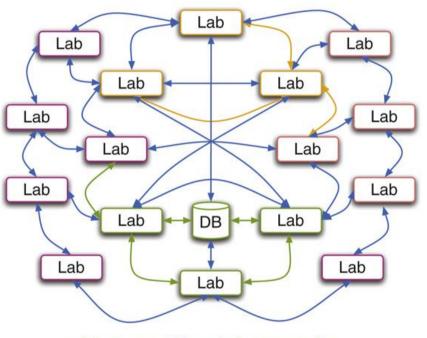


Concept: social network for drug discovery









- Interconnect the whole community
- Cross-pollinate groups
- Preserve IP/streamline agreements
- Advance drug candidates faster

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Collaborative Drug Discovery (CDD) -- an importance of data sharing

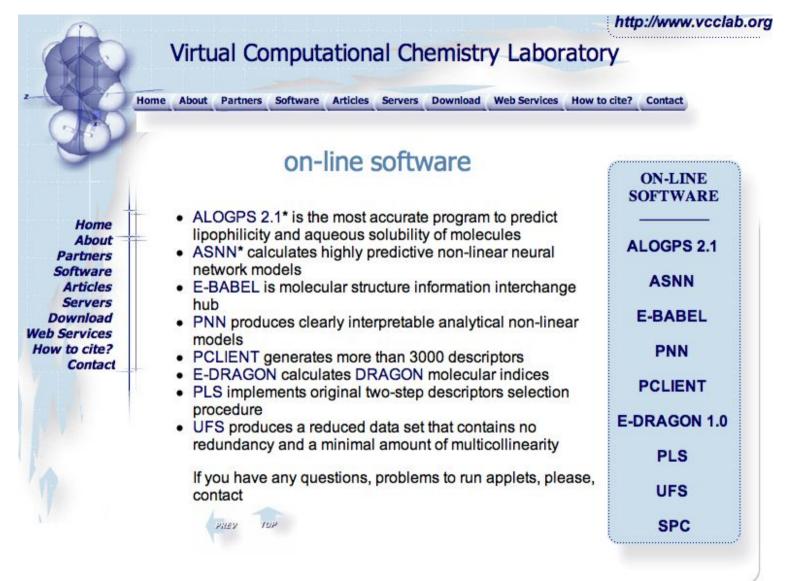
2011: CDD wins Bio-IT World Editors' Choice Best Practices Award2011: MM4TB (More Medicines for Tuberculosis) 5 year EU funded project with AstraZeneca, Sanofi-Aventis

- 2010: GSK, Novartis, Pfizer, and NIH Collaborations Announced
- 2008: Gates Foundation 2 year grant for TB database (extended to 5 years)
- 2005: Eli Lilly co-invested in a syndicate with Omidyar Network and Founders Fund
- 2004: CDD spun out of Lilly, UCSF signs up as first customer





Descriptor calculations & models development



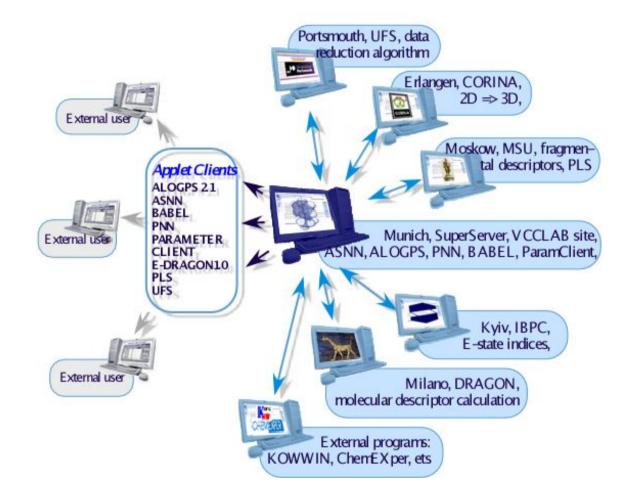
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Collaboration in VCCLAB



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VCCLAB offers:

Descriptor/property calculations

PCLIENT: Descriptor calculation using several algorithms
 eDRAGON: Web interface to Dragon (Talete Srl) descriptor calculation tool using user provided structures or CORINA (Molecular Networks GmbH)
 ALOGPS: calculation of logP and logS using ALOGPS as well as >10 other methods

On-line model development

- ASNN Associative Neural Networks
- PNN Polynomial Neural Network
- PLS Partial Least Squares

Other tools

- SPC Supermagnetic Clustering
- E-babel on-line conversion of molecules using OpenBabel
- UFS Unsupervised Forward Selection of descriptors

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Virtual Computational Chemistry Laboratory statistics

VCCLAB: 2001-2004 INTAS project "Virtual Computational Chemistry Laboratory"

- > More than 5000 unique users per month
- About 4500 registered users
- > > 230,000 tasks are calculated per year
- $> \sim 300$ citations of the primary article (~ 600 citations in Google Scholar)

But ...

Across labs EU collaboration – was great to develop but difficult to support

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Model storage: JRC, CADASTER

REACH guidelines (OECD principles):

- 1) a defined endpoint
- 2) an unambiguous algorithm
- 3) defined domain of applicability
- 4) appropriate measures of goodness-of-fit, robustness and predictivity
- 5) a mechanistic interpretation, if possible
- \rightarrow Published models may not be sufficient to fulfill all principles
- → Am authority decision is required to decide whether models fulfills "OECD principles"; once validated such "OECD" models should be stored and be available for use in REACH registration

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(Q)SAR Model Reporting Format (QMRF) Inventory



(Q)SAR Model Reporting Format Inventory



Log in Register

Home Search documents Search structures

All published QMRF documents (67) are available for download and can be searched either through free text queries or by several predefined fields.

All substances, available in the QMRF Database, can be searched by exact or similar structure.

What is QMRF Database?

Do you need to register to use the QMRF Database?

Please register only if you wish to submit a QMRF. Registration is not necessary if you only wish to search the database and access information on QMRFs.

Help

How to create an QMRF Document?

- · log in into QMRF Database and use the New document tab;
- by <u>OMRF editor</u>: once started, it will create shortcut on your desktop and can be started later even offline.

Most recent QMRF documents

# <u>QMRF#</u> 9	Title 9	Last updated 9	View	Download 🥹
1 Q27-40-8-320	Non polar narcosis QSAR for tetrahymena pyriformis acute toxicity	2011-7-26 15:12	0 🔍	🎫 📴 🔤 📠
2 <u>Q27-39-8-319</u>	Polar narcosis QSAR for tetrahymena pyriformis acute toxicity	2011-7-26 15:11	0 🔍	🏧 📆 🛋 👼
3 <u>Q19-39-8-318</u>	Polar narcosis QSAR for fathead minnow acute toxicity	2011-7-21 15:18	, Q	🏧 🎇 🛋 📾

For information about this site please contact JRC-IHCP-COMPUTOX@ec.europa.eu

This page has been accessed 15037 times since 2008-07-03 15:25:48.0

Developed by Ideaconsult Ltd. (2007-2008) on behalf of JRC



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CADASTER QSPR-THESAURUS DB



Substituted musks/fragrances

Substituted musks/fragrances, being a heterogenic group of chemicals of varying composition. Examples include substituted benzophenones, polycyclic musks, terpene derivatives. In view of their typical use pattern, the chemicals have a common emission pattern in the environment.

Triazoles/benzotriazoles

Triazoles/benzotriazoles, a class of chemicals that are increasingly used as pesticides and anti-corrosives.

Our acknowledgements

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QSPR THESAURUS: available models

Revision 5666 by midnighter checked in on 2011- Safari 5.1 on Mac - Not tested Welcome, Guest! Logout	-08-03 11:37:20. Built from 146.107.60.52 on 2011-08-03 11:53:4 CADASTER CAse studies on	he Development and Application of in-Silico Techniques for Environmental hazard and Riskassessment
Home - Database - Models -		A+ a-
Models applier browser		Area of your interest: BFR

Step 1. Select a model from the list

- 4 of 4							
Compound class	Endpoint	Partner	Reference	Training set	Method	Creation date	
BFR	Melting Point	UI	Ref.	Ester_Papa_TM (25)	MLRA	2010-07-05	8 🛄 👘 🖯
BFR	Vapor Pressure	UI	Ref.	Ester_Papa_Log_PL (34)	MLRA	2010-07-05	🖹 🛄 🖀 🖃
BFR	logPow	ÚI	Ref.	Ester_Papa_LogKOW (20)	MLRA	2010-07-05	🕙 🛄 管 日
BFR	LogKoa	UI	Ref.	Ester_Papa_LogKOA (30)	MLRA	2010-07-05	B) 📃 🖷 🖯

Next>>

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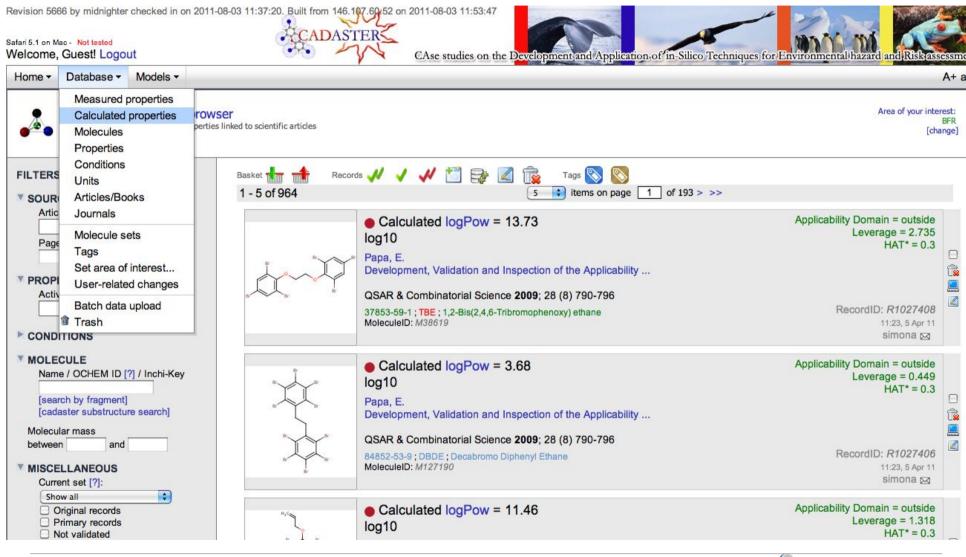
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OpenTox meeting



[change]

QSPR-THESAURUS: Browser of calculated values



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CADASTER workshop, Maribor, September 1-2, 2011



Home | Organizing Committee | Symposium Information | Registration | Accommodation | Other Information

Deadline Reminder

- Sponsorship & Exhibition
- Basic info. about Slovenia
- About Maribor
- Visas
- Social Program & Tours

Dear Colleagues,

International Scientific Advisory Board and Organizing Committees cordially invite you to take part in the 6th International Symposium on Computational Methods in Toxicology and Pharmacology Integrating Internet Resources (CMTPI-2011). The meeting will be held in Maribor, Slovenia from September 3th to 7th 2011.

Following the traditions of CMPTI-2001 (Bordeaux, France), CMTPI-2003 (Thessaloniki, Greece) and CMTPI-2005 (Shanghai, China), CMTPI-2007, (Moscow, Russia), and CMTPI-2009 (Istanbul, Turkey), CMTPI-2011 will provide an International forum for presentation and discussion on recent development and trends in Computational Toxicology and Pharmacology including the Internet resources. The Symposium will feature plenary lectures, oral talks and posters broadly covering the following fields:

Commercial and non-commercial computational tools and databases in the Internet for computational
pharmacology and toxicology

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Model Development & Publishing: ChemBench



Developed with help of NIH and EPA projects

Main motivation: enable processing of large HTS datasets, like those produced by PubChem (2600 bioassays with nearly 300 000 active molecules)

Allows: Dataset Creation, Visualization, Modeling, Model Validation, Virtual Screening (predictions)

Includes:

Random Forest SVM GA-kNN SA-kNN

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HOME	MY BENCH	DATASET	MODELING	PREDICTION	CECCR BASE
Select a Data	set				
elect Descri	ptors				
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Choose Model	Generation Metho	bd			
Start Job					
	will take about 71 days t me for the predictor you a				
Predictor Name		and the second second second	Ames set		



Carolina Exploratory Center for Cheminformatics Research All Rights Reserved (2010) CHEMBENCH Project supported by NIH (grants P20HG003898 and R01GM066940) and EPA (grants RD83382501 and RD832720)



C



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Job Queue

Running jobs from all Chembench users are displayed below. Use the REFRESH STATUS button to update the list. Other users can see your jobs while they are running, but only you can access your completed datasets, predictors, and predictions.

REFRESH STATUS

Unassigned Jobs:

(No jobs are waiting to be assigned.)

Jobs on Local Queue:

(The local processing queue is empty.)

Jobs on LSF Queue:

Statistics

Visitors: 326250 Users: 309 Jobs completed: 12477 Compute time used: 18.882 years Current Users: 2 Running Jobs: 41

<u>Name</u> ‡	<u>Owner</u> \$	<u>Job Type</u>	<u>Number of</u> Compounds	Number of Models	Time Created \$	<u>Status</u> 🗘	Cancel
BCF_test	guest	MODELING	541	20	2011-08-07 08:55	Generating models (0%)	

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HOME	MY BENCH	DATASET	MODELING	PREDICTION	CECCR BASE
Predic	ction Results				
Gold	D Page: <u>1 2 3 4 5 6 7</u> 8 Compound ID	Structure	(12) Prediction	(12) Number of Predic Total Mode	ting Models / Is
	176	$ \begin{array}{c} \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\ \\$	0.298 ± 0.061	20 / 20	
	177	07650	0.268 ± 0.086	20 / 20	
	178	ne funda internet int	0.45 ± 0.056	20 / 20	

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Web Tools for QSAR/QSPR modeling: OpenTox

FP7 project OpenTox 2008-2011 Based on AMBIT, RESTful services

Provides webservices for model development, publishing and prediction:

Extended API:

Enables 3rd parties to develop their workflow

ToxCreate:

Method:Lazar regression/classificationDescriptors:Fminer backbone refinement classes

ToxPredict:

Stores/calculates predictions for chemical compounds from ECHA list Uses about 20 models collected from literature and developed by the authors

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Web Tools for QSAR/QSPR modeling: OpenTox

Open	Site Map Accessibility Contact Log in Join Search Site							
Home Applications	Downloads Tutorials OpenTox Blog Development OpenToxipedia Meet							
Framework Description	Activity API Mailinglist Documentation Files Requirements Testing Ontology							
API	You are here: Home » Development » API » API 1.1 - current version API 1.1							
API 1.2 - future version API 1.1 - current version	Interface specifications for OpenTox services (Version 1.1, November 2009). Common specifications for all APIs							
Overview Compound	OpenTox components are webservices with a REST (http://en.wikipedia.org/wiki/Representational_State_Transfer) interface.							
Feature Dataset	Parameters Parameters are posted with a "Content-Type:application/x-www-form-urlencoded" HTTP header. Parameter names are typed in bold letters in the API definitions. Square brackets (e.g. compound_uris[]) indicate that a list of arguments is expected.							
Algorithm Model Validation	Ampersands in URI attribute values (e.g. dataset_uri= "/dataset/abc?feature_uri=/feature/x&feature_uri=/feature/z") should be escaped, as explained in http://www.w3.org/TR/html401/appendix/notes.html#ampersands-in-uris							
Task Report	For curl POST requests the -d/data option should be used to ensure the content type. See http://curl.haxx.se /docs/manpage.html#-ddata for more information on the -d parameter.							
Authentication and Authorisation	Example: curl -X GET http://{server}/dataset?compound_uris[]={compound_uri1}&compound_uris[]={compound_uri2})							
Feature ontology	curl -X POST -d 'dataset_uri=http://{server}/dataset/5' http://{server}/algorithm/xxx							
Algorithm ontology	Request and submit formats							

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Model development using OpenTox

Creates computational models to predict toxicity



Create Inspect Predict Help

You will need to upload training data that includes chemical structures and their measured toxicity values, in **Excel**, **CSV** or **SDF** file formats to create a prediction model. Please read the **instructions for creating training datasets** before submitting.

Upload training data in Excel , CSV or SDF format: Choose File no file selected

Create model

This service creates and validates new *classification* and *regression* structure-activity models from your experimental data. The models can be used to predict toxicity of new chemicals (e.g. for **REACH** & purposes) and to reduce the need for animal testing. The following methods are currently available:

- · lazar classification models and
- lazar regression models (experimental)

Further modelling algorithms may be added in future versions.

Disclaimer: ToxCreate uses state-of-the-art published and tested algorithms and methodologies with full validation information. However, just as with experimental measurements, computational predictions are subject to varying degrees of accuracy and uncertainty, so please read the full report carefully, particularly the validation information. No liability is accepted for any inaccuracy in predictions.

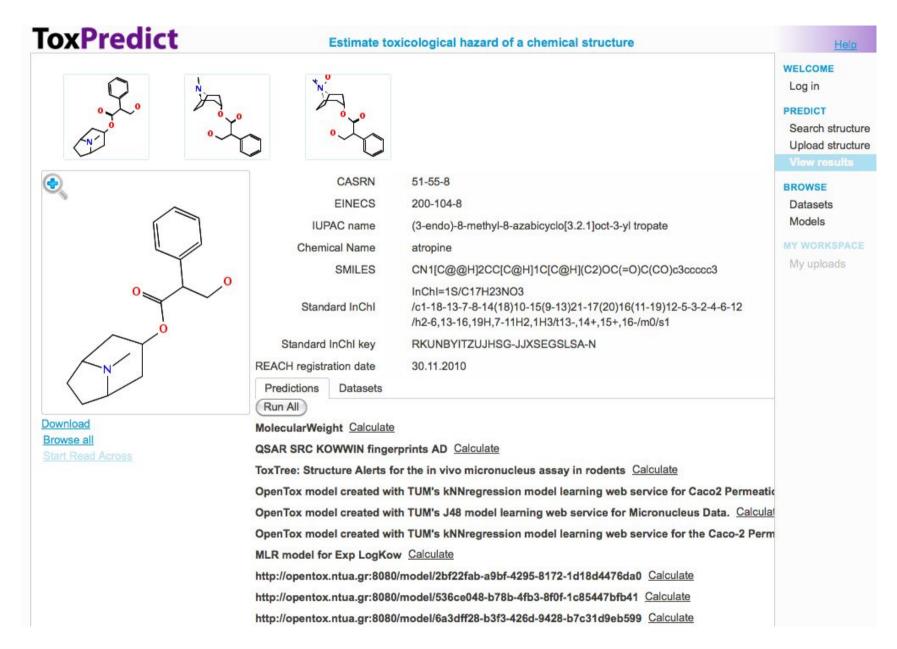
Version: v2.1.0 , Date: Thu Aug 4 18:38:58 2011 +0200 Date: Thu Aug 4 18:38:58 2011 +0200

💿 in silico toxicology 🖗 2009-2011, powered by OpenTox 🖗 (a project funded by the 7th Framework Programme 🖗 of the European Commission)

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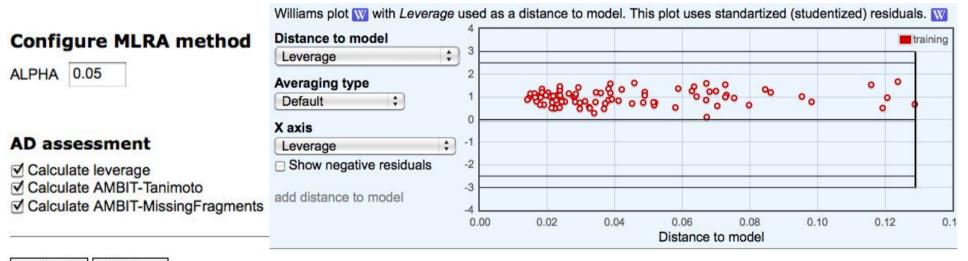
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OpenTox & CADASTER collaboration using API:

Web tools for similarity searching Web tools for Applicability Domain calculations

Realized as calls to respective web services of OpenTox by means of LINUX "curl" command line tools



<<Back Next>>

OpenTox meeting



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Database & model: OCHEM – On-line Chemical Modeling Environment http://ochem.eu

Basket 🐈 👬 Records 🗸 💉 📩 🕞 🛃 🔞 Tags 🚫 🚫 V SOURCE Article/Source [select] 5 \$ items on page 1 of 26492 > >> 1 - 5 of 132460 Page Table % Plasma protein binding = 90.0 Saiakhov R.D., Stefan L.R., Klopman G. Multiple computer-automated structure evaluation model of th... **PROPERTY** The state N: 153 P: 139 T: 1 Activity/Property [select] 2000; 19 (1) 133-155 Verapamil 16:17, 11 Jul 10 ▶ CONDITIONS charochkina 🖂 **WOLECULE** Name / QID / InchiKey % Plasma protein binding = 93.0 [search by fragment] Saiakhov R.D., Stefan L.R., Klopman G. [cadaster substructure search] Multiple computer-automated structure evaluation model of th... n. N: 152 P: 139 T: 1 **MISCELLANEOUS** 2000: 19 (1) 133-155 Current set [?]: \$ Show all Valproic acid 16:17, 11 Jul 10 Records by introducers: charochkina 🖂 All users \$ Original records Primary records % Plasma protein binding = 50.0 Not validated Saiakhov R.D., Stefan L.R., Klopman G. Error records Multiple computer-automated structure evaluation model of th. R Error inchies N: 151 P: 139 T: 1 Mismatching names 2000; 19 (1) 133-155 Include stereochem. Empty molecules Tubocurarine 16:17, 11 Jul 10 charochkina 🖂 Sort by: Creation time % Plasma protein binding = 37.5 REFRESH RESET Saiakhov R.D., Stefan L.R., Klopman G. Multiple computer-automated structure evaluation model of th... n k N: 150 P: 139 T: 1 2000; 19 (1) 133-155 Trimethoprim 16:17, 11 Jul 10 charochkina 🖂

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Compounds properties browser

Search for numerical compounds properties linked to scientific articles

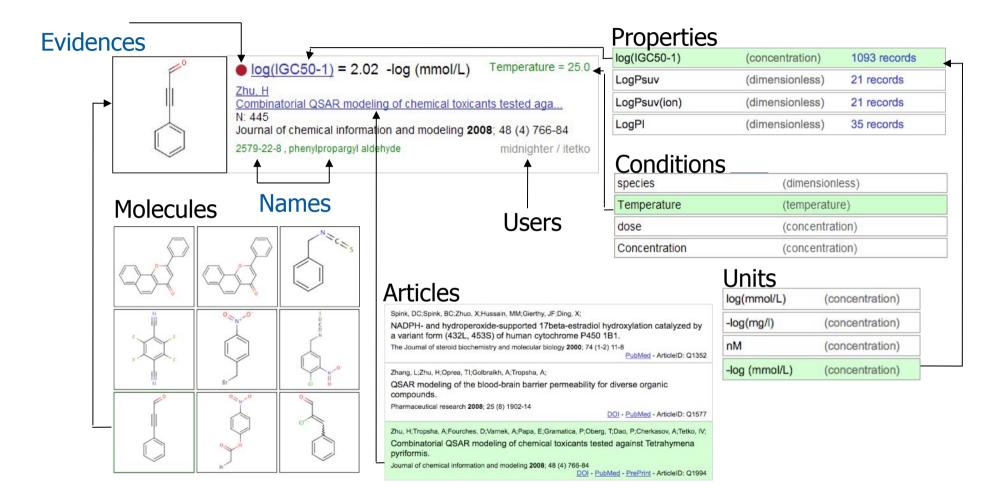
OpenTox meeting



Area of your interest:

no tags selected [change]

Database schema Simplified overview



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QSPR/QSAR modelling in OCHEM

Select model template

Training set (required): [...] Validation set (optional): [...]

Choose template for the model:

ASNN (ASsociative Neural Networks)
 W

- O Consensus model (experimental) W
- FSMLR (Fast Stagewise Multiple Linear Regression) W
- KNN (K-Nearest Neighbors) W
- KPLS_mathematica W
- KRR (Kernel Ridge Regression) W
- LibSVM wrapper with grid-search parameter optimisation W
- LogP-LIBRARY W
- OMLR (Multiple Linear Regression)
- O PLS (Partial Least Square) W
- SVM (Support Vector Machines) W
- WEKA-J48 (Weka-based implementation of C4.5 decision tree) W
- WEKA-RF (Weka-based implementation of Random Forest) W

Model validation

Validation method: N-Fold cross-validation \$

Number of folds: 5

Stratified cross-validation

Select descriptor blocks

Please select the MOLECULAR descriptors: E-state W OEState ALogPS (2) AMBIT Descriptors W MolPrint GSFragment (1138) Dragon v. 5.4 (1630/3D) W Dragon v. 5.5 (3190/3D) W Dragon v. 6.0 (4885/3D) W ISIDA fragments W ISIDA fragments (2011) W MOPAC descriptors (21/3D) W ADRIANA.Code (211/3D) CDK descriptors (246/3D) QNPR W □ ShapeSignatures (3D) W Inductive' descriptors (54/3D) W MERA descriptors (529/3D) W MERSY descriptors (42/3D) W Vina Docking descriptors (alfa version)(3D) Chemaxon descriptors (499/3D) Chiral Descriptors (/3D) W ETM descriptors Spectrophores (144/3D) W

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Models: it's everything about reliability

Overview	Applicabi	lity doma	in							
Model name: levenberg , published in Applicability dom to achieve accuracy of experimental measurements put Predicted property: AMES Training method: ANN										[EState], Correl. limit: 0.95 1000 iterations, 3 neurons 5-fold cross-validation 233 filtered descriptors 1000 iterations, 3 neurons
Data Set					A	Accuracy			Cal	culated in 548344 seconds
Training s	et: Ames cl	nallenge t	raining (4	4361 rec	ords)	77.5%				
Test set: A	mes challe	enge test	(2181 red	cords)		78.5%				
					27					
Real↓/P	redicted→	inactive	active	R	eal↓/Pre	edicted→	inactive	active		
ina	active	1496	521		inac	tive	769	240		
		_								

For more details: see poster

Applicability domain estimation for classification QSARs on example of Ames test and CYP450 inhibition



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OCHEM statistics

Available data

>200k records
>200 properties
>7000 articles

Descriptors 20 providers

Algorithms

10 methods

Model development facilities

120M entries, e.g. 120,000 molecules with 1,000 descriptors each Limitation on the size of the model is 1G (mysql query) Parallel processing on more than 400 CPUs

Available models

LogP, aqueous solubility, solubility in 5% and 100% DMSO, several pKa models, AMES test, CYP450, environmental toxicity + several other properties in development

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"Environmental ChemOInformatics" (ECO) school at UFS Schneefernerhaus, Zugspitze, http://eco-itn.eu



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Conclusions

Web tools are invaluable resources for collaboration on the web

- Important tools for REACH
- Development of web tools become more and more popular
- Several large projects, like eTOX, Open PHACTS, were launched
- Large companies demonstrate their interest in sharing pre-competitive data

Future trends:

Ontologies for better structuring of complex data and for integration of heterogeneous databases

Data sharing

Integration of in vitro and in silico data to model in vivo toxicities

Data curation and annotation

Text mining

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Eva Schlosser Iurii Sushko Vlad Kholodovych Wolfram Teetz Robert Körner Ahmed Abdelaziz Sergii Novotarskyi Stefan Brandmaier Jacques Ehret

CADASTER FP7 ECO MC ITN







INTAS



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