AMER WER AND MODELS VIA AMERICAL DATA AND MODELS VIA CHEMICOX API **NINA JELIAZKOVA** IdeaConsult Ltd. Sofia, Bulgaria www.ideaconsult.net

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# **IDEACONSULT LTD.**

**IO***F***A** Consult

Based in Sofia, Bulgaria

7/18/2013

Provides consultancy, technical services and software development in the areas of chemoinformatics, QSAR and data mining since 2004;

- Develops and maintains several open source software products, designed and developed in close co-operation with academia, regulatory bodies and industry. Examples:
- <u>Toxtree (toxicity prediction, threshold of toxicological concern estimation);</u>
- <u>Toxmatch</u> (for encoding and applying chemical similarity indices);
- <u>Ambit</u> (a QSAR decision support system, including generic database management, structure conversions and searching, as well as applicability domain assessment); <u>Ambit REST web services;</u>
- (Q)SAR model reporting format (QMRF) inventory;

Partner in several EU FP7 funded projects:

CADASTER (2009-2012), OPENTOX (2008-2011), TOXBANK (2010-2015) (SEURAT-1 cluster); Associated partner in the EU FP7 project OpenPHACTS;

http://www.ideaconsult.net

## AMBIT

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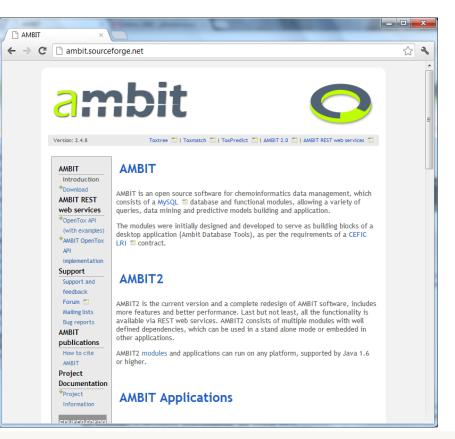
#### • AMBIT, AMBIT XT

CEFIC Long Range Research Initiative project *"Building blocks for a future (Q)SAR decision support system: databases, applicability domain, similarity assessment and structure conversions"*; Ambit XT (Standalone GUI, workflow)

#### AMBIT REST web services

- OpenTox Application Programming Interface (API)
- Web Applications using AMBIT REST web services

### http://ambit.sf.net



#### Software

Highly accessed

**Open Access** 

AMBIT RESTful web services: an implementation of the OpenTox application programming interface



Journal of Cheminformatics

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### **AMBIT WEB SERVICES**

#### DATASET WEB SERVICE

- Chemical structure query
- Upload chemical compounds and properties
- Data collation

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- Built-in heuristics for automatic discovery of 2D chemical structure inconsistencies;
- Uploading a file with chemical structures and properties makes it automatically available in several formats; structure and similarity searchable;

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Available as online services, as a downloadable archive or Virtual Machine appliance

# **DATASETS WEB SERVICES**

- AMBIT uses MySQL with a flexible database schema.
- There are no predefined field names for chemical properties.
- The properties are annotated with ontology entries
- The OpenTox API is database engine and database schema agnostic
- Supports common chemical formats for data import

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Default database content :

Aggregation of data from multiple sources

ECHA list of pre-registered substances, EPA DSSTox, ECETOC skin irritation, LLNA skin sensitisation Bioconcentration factor (BCF) Gold Database Standard ToxCast Benchmark Data Set for pKa Prediction, Benchmark Data Set for In Silico Prediction of Ames Mutagenicity, Bursi AMES Toxicity Dataset, EpiSuite data, PubChem subset, confidential data, etc.

Download: The resources are serialized in various formats (RDF, JSON, SDF, etc.)

### **AMBIT WEB SERVICES**

#### COMPUTING SERVICES

- Descriptor calculation (CDK, MOPAC, Dragon, etc.);
- Model building methods (classification, regression, clustering);
- Expert rules (Toxtree);
- Applicability domain assessment;
- Chemical landscape analysis
- Tautomer generation

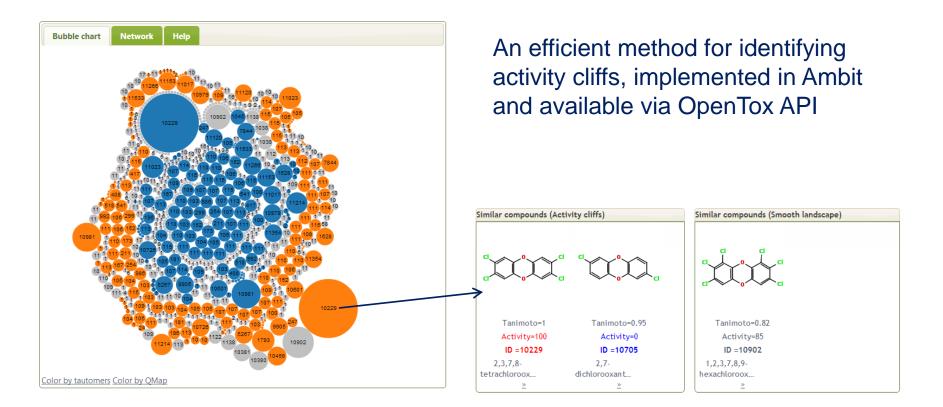
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• Wrappers for third party tools and web services.



Calculations launched in in an uniform way (REST API)

### **CHEMICAL LANDCAPES ANALYSIS**



Curr Top Med Chem. 2012;12(18):1987-2001.

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#### Chemical landscape analysis with the OpenTox framework.

<u>Jeliazkova N, Jeliazkov V</u>. Ideaconsult Ltd., 4 A.Kanchev str., Sofia 1000, Bulgaria. jeliazkova.nina@gmail.com

# AMBIT IT TECH

#### REQUIREMENTS

Server:

- Java 1.6, 1.7
- Tomcat 5.5, 6.x, 7.x
- MySQL 5.5

Clients:

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- Modern JavaScript enabled browser
- Desktop applications
- Workflow engines

#### MAIN LIBRARIES

- The Chemistry Development Kit
- AMBIT SMARTS
- AMBIT SMIRKS
- AMBIT Tautomers
- InChl / JNI-INCHI
- Restlet (REST)
- Machine learning (Weka , etc.)

The clients communicate via OpenTox API (Application programming Interface)

# **AMBIT WEB SERVICES AS BUILDING BLOCKS**

- Web applications
- <u>http://ToxPredict.org</u> aggregates remote predictions
- OpenTox API Wrapper for SOAP web services
- QMRF database (server & client)
- Applicability domain used by CADASTER web site (client)
- REPDOSE structure & similarity search <u>www.repdose.de</u>
- Xenobiotics Metabolism Database XMetDB (server & client)
- Bioclipse OpenTox (client)
- CheS-Mapper (client)

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- Toxbank structure search (server & client)
- **Toxtree web edition** (AJAX client)

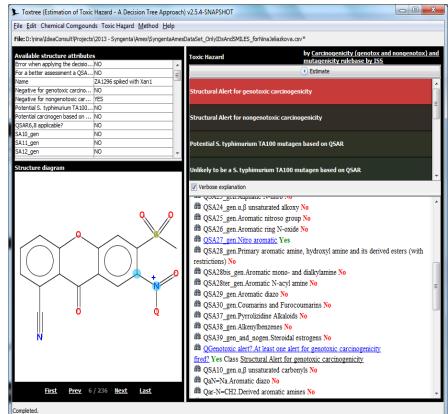
# **TOXTREE 2.6.0**

Estimates toxic hazard by applying expert defined rules, arranged as a decision tree. Commissioned 2005 by JRC.

**17 plugins:** Cramer rules , <u>Verhaar</u> <u>scheme</u> , Skin irritation, Eye irritation, Mutagenicity and carcinogenicity, Biodegradation, Reactivity domains, Protein binding, TTC Decision tree, SMARTCyp , in vivo micronucleus assay in rodents , Structural Alerts for Functional Groups, etc.

New decision trees can be built with the GUI or by developing new plugins in Java code

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# Download at http://toxtree.sourceforge.net

# HTTP://TOXTREE.SF.NET/PREDICT

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http://apps.ideaconsul	t.net:8080/ambit2	:	Alert for SN2 identified. No skin sensitisation reactivity domains alerts identified.		vo)			

### AJAX interface for Toxtree Frontend (JavaScript only)

 anywhere (copy JS and html to your site)

# Backend (Ambit web services)

• anywhere (uri parameter)

#### Code at github

https://github.com/ideaconsult/Toxtree.js



Web interface for Toxtree Ambit web services serve as a backend database and calculation

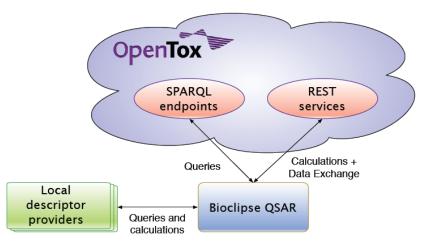
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# **AMBIT WEB SERVICES AS BUILDING BLOCKS**

### **Desktop applications**

- Bioclipse (<u>www.bioclipse.net</u>) dynamically discovers computational algorithms exposed via the OpenTox servers
- There is a (SPARQL) registry of available data and computational services <u>http://apps.ideaconsult.net:8080/ontology</u>
- When a new descriptor algorithm or model is registered on the OpenTox ontology service, it will automatically be picked up by Bioclipse.

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Willighagen E., Jeliazkova N., Hardy B., Grafstrom R., Spjuth O., <u>Computational toxicology using the OpenTox application</u> <u>programming interface and Bioclipse</u>, BMC Research Notes 2011 4 (1), 487

# **EU FP7 PROJECT OPENTOX**

#### An Open Source Predictive Toxicology Framework

- European Commission Framework Program 7 funded project (2008-2011)
- Objective: develop a distributed framework for predictive toxicology.
- The building blocks considered are : data, chemical structures, algorithms and models.
- The framework allows to build models, apply models, validate models, access and query data in various ways.
- Technologies used are <u>REST style web services</u> and <u>W3C Resource</u> <u>Description Framework</u> for description of services.
- 11 partners



## **OPENTOX API**

Unified REST web services for the most important common components for predictive toxicology

OpenTox is a distributed framework by design. There are several implementations of the OpenTox API

**OpenTox API** Model Validation Dataset GET GET GET POST POST POST PUT PUT PUT DELETE DELETE DELETE Feature Compound Algorithm Ontology GET GET GET POST POST POST PUT PUT PUT GET POST DELETE DELETE DELETE PUT DELETE 111412013 14 IDEACONSULT LTD.

**Report** 

GET POST

PUT

DELETE

## **OPENTOX API CRASH COURSE \***

#### 1) Find a compound by an identifier, structure, similarity, substructure

curl –X GET http://host/query/compound/search/all?search=caffeine

Returns the URI of the compound <u>http://host/compound/328</u>

curl –X GET http://host/query/smarts?search=c1cccnc1-c2ncccc2

Returns URIs of the hits <u>http://host/compound/456</u>

#### 2) Find a predictive model

curl -X GET http://host/model

#### Returns URI of the available models, e.g. http://host/model/8

#### 3) Apply the model to the compound

curl -X POST http://host/model/8 -d "dataset\_uri=http://host/compound/328"

- Returns URI of the results, e.g. <u>http://host/dataset/999</u>
- The results can be retrieved in all chemical MIME formats, as well RDF/XML, N3, CSV, ARFF, JSON, JSONP

#### \* with the help of cURL http://curl.haxx.se/

# **AMBIT: IMPORT A NEW DATASET**

# Uploads datasets in common chemical formats; No predefined fields; Unique URI assigned

AMBIT @ sourceforge.net | Help | Log in | Register



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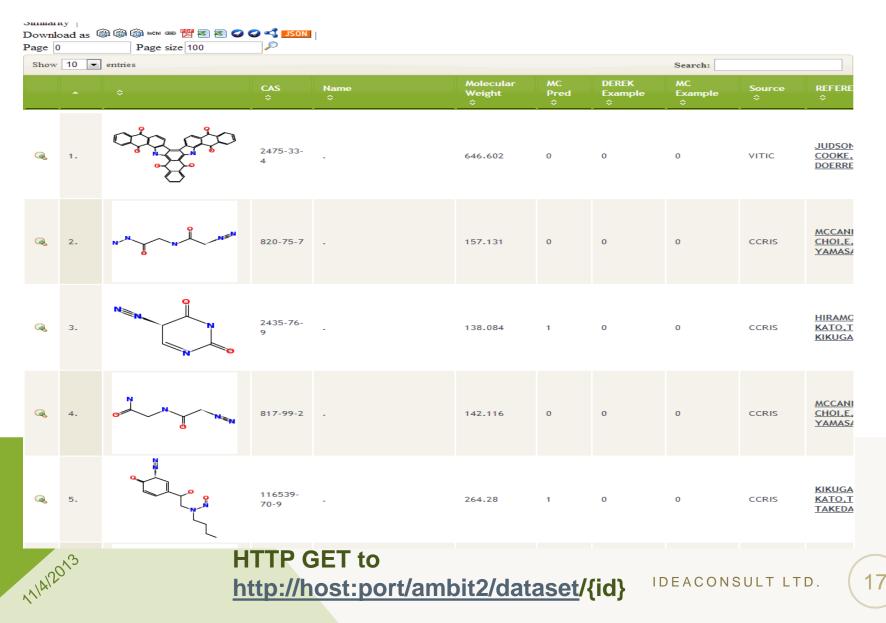
#### Structure and properties import

Upload a dataset of chemical structures and properties. Supported formats are SDF, MOL, SMI, CSV, TXT, XLS, ToxML (.xml)

✿ Home	Import new datas	et	Help: Import
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All datasets	Dataset name ?	Benchmark Data Set for In Silico Prediction of Ame	upload a file with
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Build model			structure
📕 Algorithms			
Algoritmits			
Models			

HTTP POST to <u>http://host:port/ambit2/dataset</u> <u>http://host:port/ambit2/compound</u> Uniform interface: (OpenTox web services API)

### THE DATASET UPLOADED



# **VIEW DATASET COLUMNS**

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#### HTTP GET to http://bost:port/ambit2/datase

http://host:port/ambit2/dataset/{id}/feature

### v2.5.2-SNAPSHOT

Structure search

◎ Exact structure ◎ Similarity ◎ Substructure Enter SMARTS or draw a structure.

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Functional groups		Draw (sub)structure	

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#### **HTTP GET**

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## **SEARCH ALL DATASETS**

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**HTTP GET** http://host:port/ambit2/dataset

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Algorithms Descriptor calculations, model building and data processing algorithms

Search

♠ <u>Home</u>	Showing 66 algorithms (11 to 20)		First Previou: 1	2 3 4	5 Next	Last	
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≁ <u>Machine learning</u>							
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#### **HTTP GET** http://host:port/ambit2/algorithm

## CALCULATE DESCRIPTORS EXAMPLE:BCUT (CDK)

AMBIT @ sourceforge.net | Help | Log in | Register

ambit v2.5.2-SNAPSHOT

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#### **Algorithms**

Descriptor calculations, model building and data processing algorithms

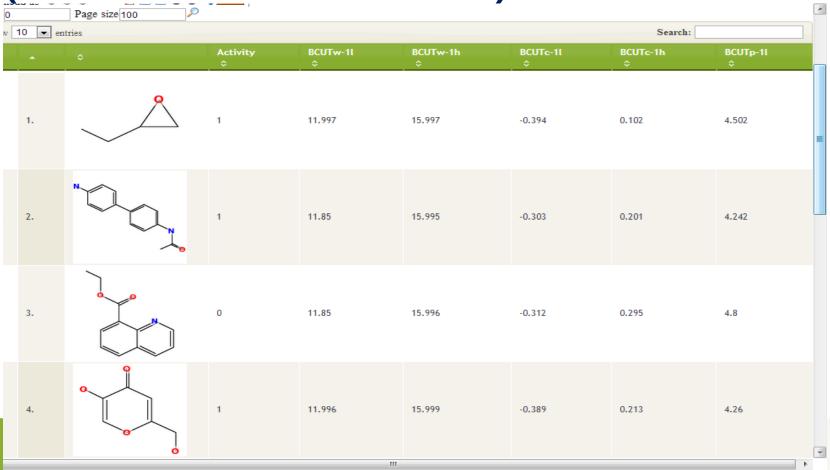
Search

♠ <u>Home</u>	Algorithm at <u>http://localhost</u>	:8080/ambit2/algorithm/org.openscience.cdk.qsar.descrip	tors.molecular.BCUTDescriptor	Help: Algorithm
All algorithms	Name	BCUT descriptors		service What is Algorithm
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Expert rules	Requires	Chemical structure		SuperBuilder ?   Algorithm types ?   <u>API</u>
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Machine learning	Action	Processes a dataset	The result is a dataset, identified by a <u>dataset</u>	
Regression			<u>URI</u> .	
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📕 <u>Clustering</u>		Run		
FeatureSelection				
Supervised				
UnSupervised				

HTTP POST to <u>http://host:port/ambit2/algorithm</u> Parameter: dataset\_uri=http://host:port/ambit2/dataset/id

### THE TRAINING DATASET

### (ACTIVITY & DESCRIPTORS)



HTTP GET http://host:port/ambit2/dataset/{id}

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#### Algorithms

Descriptor calculations, model building and data processing algorithms

Search

▲ Home	Showing 9 algorithms (1 to 9)			Fi	rst Previous	1 Next Last
All algorithms	Name ≎	Endpoint ?	Description $\diamond$	Type ? ♀	Models ?≎	Implementation of ? \$
<ul> <li><u>Descriptor Calculation</u></li> <li><u>Expert rules</u></li> <li><u>Toxtree</u></li> </ul>	ℓ <u>LR</u> Regression: Linear regression		<ul> <li>■ Builds a model.</li> <li>■ Requires input dataset</li> <li>■ Requires property</li> <li>■ Requires target variable</li> </ul>	<u>Regression</u> <u>SingleTarget</u> <u>EagerLearning</u> <u>Supervised</u>	■ <u>View</u>	ď
Machine learning  Machine lear			<ul> <li>₱ Builds a model.</li> <li>₱ Requires input dataset</li> <li>₱ Requires property</li> <li>₱ Requires target variable</li> </ul>	<u>Regression</u> <u>SingleTarget</u> <u>EagerLearning</u> <u>Supervised</u>	■ <u>View</u>	C <sup>*</sup>
<ul> <li>Clustering</li> <li>FeatureSelection</li> <li>Supervised</li> </ul>			<ul> <li>■ Builds a model.</li> <li>■ Requires input dataset</li> <li>■ Requires property</li> <li>■ Requires target variable</li> </ul>	<u>Regression</u> <u>SingleTarget</u> <u>EagerLearning</u> <u>Supervised</u>	■ <u>View</u>	Ľ*
<ul> <li><u>UnSupervised</u></li> <li><u>Single Target</u></li> <li><u>Multiple Targets</u></li> </ul>	<i>₽</i> <u>MLP</u> Multilayer Perceptron		₹ Builds a model. ₹ Requires input dataset ₹ Requires property ₹ Requires target variable	Regression Classification SingleTarget EagerLearning Supervised	■ <u>View</u>	C <sup>4</sup>
<ul> <li><u>Eager Learning</u></li> <li><u>Instance (lazy) learning</u></li> <li><u>Applicability domain</u></li> </ul>	PaceRegression     Pace Regression     http://hdl.handle.net/10289/2131		<sup>∓</sup> Builds a model. <sup>∓</sup> Requires input dataset <sup>∓</sup> Requires property <sup>∓</sup> Requires target variable	<u>Regression</u> <u>SingleTarget</u> <u>EagerLearning</u> <u>Supervised</u>	■ <u>View</u>	C.

#### HTTP GET http://host:port/ambit2/algorithm

## **BUILD A MODEL**

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mbit

#### Algorithms

Descriptor calculations, model building and data processing algorithms

Search

-				
• Home	Algorithm at <u>http://localhost:80</u>	080/ambit2/algorithm/RandomForest		Help: Algorithm
All algorithms	Name	Constructs random forest. doi:10.1023/A:1010933404324		what is Algorithm
<ul> <li><u>Descriptor</u></li> <li><u>alculation</u></li> <li><u>Expert rules</u></li> </ul>	Implementation of Requires	property		SuperBuilder ?   Algorithm types ?
Toxtree	Туре	Classification   SingleTarget   EagerLearning   Supe	ervised	API
Machine learning	Action	Builds a model	Once a model is built, it is assigned a model UR	
Regression			and can be applied to	
Classification			datasets and compounds.	
Clustering	Enter a dataset URI	http://localhost:8080/ambit2/dataset/R25534	?	
FeatureSelection	Enter URI of the target variable	Ad	?	
Supervised		F365: BCUTw-1I		
UnSupervised		F366: BCUTw-1h		
🕗 <u>Single Target</u>		F367: BCUTc-1I		
🕗 <u>Multiple Targets</u>	L	F368: BCUTc-1h	=	J
🕗 Eager Learning		F369: BCUTp-1I		
Instance (lazy) arning		F370: BCUTp-1h		
Applicability domain		F1593: Activity	-	

SuperService



#### HTTP POST to

http://host:port/ambit2/algorithm/{id}

**Creates a model** 

http://host:port/ambit2/model/{id}

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### THE NEW MODEL



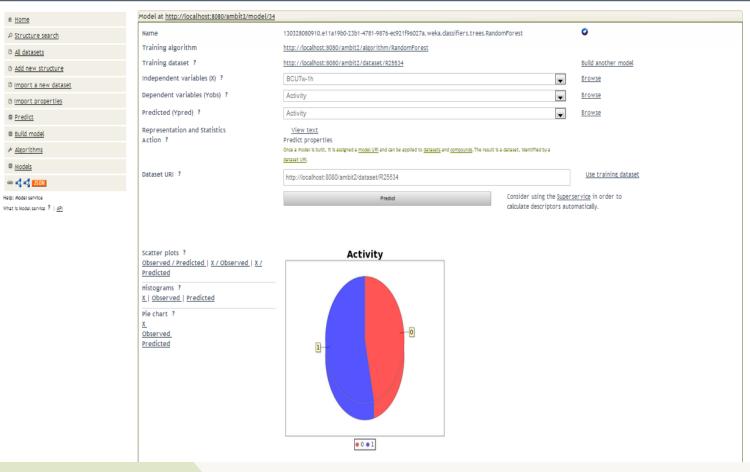
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#### Models

Regression, dassification, dustering, structural alerts, applicability domain, structure optimisation.

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HTTP GET http://host:port/ambit2/model/{id}

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# **PREDICTION RESULTS**

- Stored in the database. Also assigned web addresses (URIs)
- Collation with experimental data as previously shown (URI parameters)
- Downloadable in multiple formats

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ow 2		Page size 10	🔊 🔊 🕅 🔧 <mark>ISON</mark>	Identifiers   🗹 Names   🕅 SMILES	🔲 InChI   🗷 Endpoints   🗷 Calcu	lated   🗹 Properties   🗖 Similarity	
-	5 💌 en	tries				Search:	
	•	CAS ≎	Function ≎	toxTree.tree.cramer.CramerRules ≎	ActivityOutcome CPDBAS_MultiCellCall ≎	ActivityOutcome CPDBAS_Mutagenicity ≎	
8	51.	632-99-5	Hair dyeing	High (Class III)	inactive	active	
8	52.	100-52-7	Solvent	Low (Class I)	active	inactive	
2	53.	65-85-0	Preservative	Low (Class I)		inactive	
L	54.	95-14-7	Antimicrobial	High (Class III)	inactive	active	
L	55.	140-11-4	Solvent	Low (Class I)	active	inactive	
8	56.	100-51-6	Preservative/solvent	Low (Class I)	inactive	inactive	
L	57.	7235-40-7	Skin conditioning	Low (Class I)	inactive	active	
L	58.	25013-16-5	Antioxidant	Low (Class I)	active	inactive	
L	59.	128-37-0	Antioxidant	Intermediate (Class II)	active	inactive	
L	60.	7787-59-9	Cosmetic colorant	High (Class III)			
L	61.	10043-35-3	Antimicrobial	High (Class III)	inactive	inactive	
ł	62.	2519-30-4	Hair dyeing	High (Class III)	inactive		
L	63.	111-76-2	Solvent	Low (Class I)	active	inactive	
L	64.	94-26-8	Preservative	Low (Class I)	inactive	inactive	
	65.	96-48-0	Solvent	Low (Class I)	inactive	inactive	
L	66.	58-08-2	Skin conditioning	High (Class III)	inactive	inactive	
a.	67.	62-54-4	Viscosity controlling	High (Class III)			

Use a model: HTTP POST to <u>http://host:port/model/id</u> The result is a dataset URI

### **MODELS COMPARISON**

Webpage Screenshot



#### **Models**

Regression, classification, clustering, structural alerts, applicability domain, structure optimisation.

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Search

â Home	Showing 7 models (1 to 7)				First Previous 1 Next Last						
P <u>Structure search</u>	ID		Title ≎	Training	Algorithm		RMSE	RMSE	Correct	Correct	Stats
<ul> <li><u>All datasets</u></li> <li>Add new structure</li> </ul>	\$			Dataset ¢			(TR) \$	(CV) ≎	% (TR) ≎	% (CV) ≎	\$
Import a new     dataset     Import properties	₽ <u>M102</u> ₪	*5	130325032529.130c34be-9e56-4d26-8bad- 8bc856c076a8.weka.classifiers.bayes.BayesNet	<u>R6967</u> 🔳			0.54	0.545	66.759	66.375	<u>CV</u> <u>Training</u>
<ul> <li><u>Predict</u></li> <li>Build model</li> </ul>	₽ <u>M103</u>	*5	130325032803.22db957c-7885-4a79-97d8- 7cce761cf8ec.weka.dassifiers.bayes.BayesNet	<u>R6967</u> 🕮	BayesNet		0.54	0.544	66.759	66.406	<u>CV</u> <u>Training</u>
<ul> <li><u>Algorithms</u></li> <li>Models</li> </ul>	₽ <u>M104</u> ₪	*5	130325034041.a0b16c4a-729f-40db-931b- 0c4abf3b214e.weka.classifiers.trees.RandomForest	<u>R6967</u> 🔳	RandomFore	est	0.167	0.391	98.74	78.203	<u>CV</u> Training
MODELS	₽ <u>M106</u>	<b>*</b> 5	130325043857.3157ced5-7535-4e63-80f1- 21d551673246.weka.dassifiers.trees.J48	<u>R6967</u> 🔳	✓ <u>J48</u>		0.261	0.454	92.012	76.221	<u>CV</u> Training
What is Model service ?   <u>API</u>	₽ <u>M107</u> Г	*5	130325050702.a6ddb0a4-effe-4ca6-9274- c71c9a0174f3.weka.classifiers.functions.SM0	<u>R6967</u> 🕮	SMO		0.534	0.536	71.521	71.321	<u>CV</u> Training
	<i>₽</i> <u>M145</u> Г	*5	06f9f5ce-7dd1-4e70-a3f8- 27c8907b8094.Fingerprints (Missing fragments)	<u>R6967</u> 📾	fpmissingfragm ambit	ients					
	₽ <u>M108</u> ■	<b>*</b> 9	e5f16606-907e-4be5-80b8- 9ac15fb5e68b.Fingerprints (Tanimoto)	<u>R6967</u> 🕮	fptanimoto ambit						
	Display 10 models	•						Search:			
	TP (		T st:port/ambit2/model					I D E A	CONS	ULT L	ΓD.

# **HOW TO CREATE/PUBLISH A MODEL**

#### Upload the training set and rebuild the model;

Example: Upload the training dataset and run a classification algorithm

# Develop an OpenTox API compatible solutions, allowing to train and run predictive models;

Example: Lazar models, OpenTox partner models (BG, DE, CH, GR, RU)

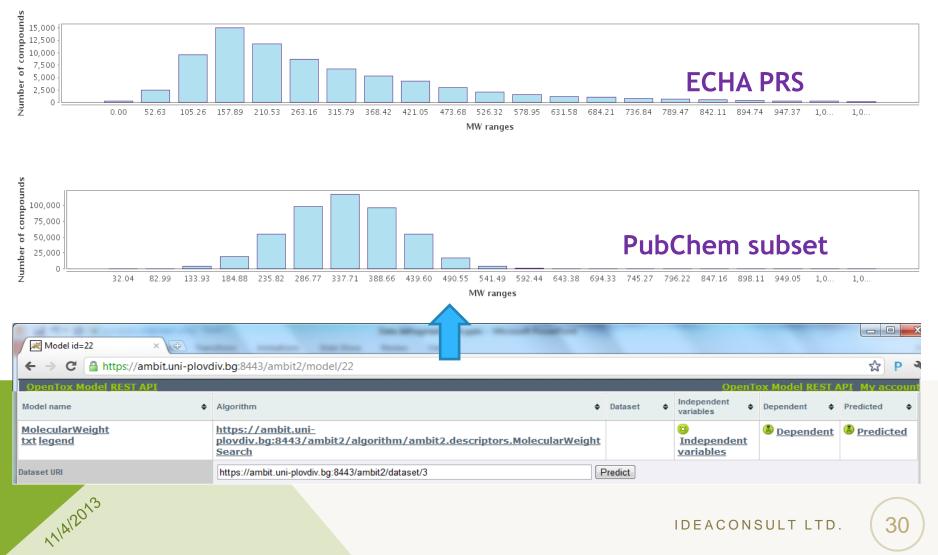
# Use thin wrappers for third-party models, and exposing them through the compatible web service API.

 Models available via SOAP services only had been exposed as OpenTox API compatible models using this approach

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All models become potentially visible to client applications (ToxPredict, Bioclipse), subject to access rights.

#### **DATASET COMPARISON** (USING AMBIT ALGORITHMS AND MODELS)



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# **CHEMBL 16 EXAMPLE**

Structures(1.2 mln) uploaded as a dataset

# Toxtree protein binding prediction

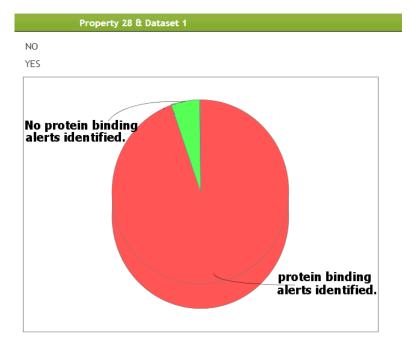
available in AMBIT via OpenTox Algorithm API results on the right Compared with ECHA Preregistration Lis1

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Only 10% (~13000) of ECHA PRS entries (~130000) are found in ChEMBL (~1.2 mln)

# ambit

Dataset <u>http://localhost:8080/ambit2/dataset/1</u> Property <u>No protein binding alerts identified.</u>



## **DATASET COMPARISON (MULTIPLE DATASETS)**

Dataset	ECHA Li	ChemIDp	Chemica	ChemDra	CPDBAS	DBPCAN	EPAFHM	FDAMDD
ECHA li	143835	55.9%	50.7%	15.786	0.2%	0.151	0.4%	0.6%
ChemIDp	100.0%	\$0468	88.4%	27.9%	1.7%	0.2%	0.7%	1.1%
Chemica	100.0%	97.5%	72985	30.5%	1.2%	0.2%	0.8%	1.2%
ChemDra	100.0%	99.6%	98.8%	22519	2.0%	0.6%	2.13+	1.0%
CPDBAS	67.3%	66.9%	67,2%	43.9%	1485	0.996	6.5%	10.1%
DBPCAN	65.6%	65.1%	65.6%	50.8%	2.4%	209	6.2%	0.6%
EPAFHM	92.5%	92.5%	92.4%	78.3%	15.6%	2.1%	617	2.494
FDAMDD	71.7%	74 791		set EPAFHN	17 285	a ne.	4.225	1215
HPVCSI				red substar			124	1.23
HPVISD	88 1 No	imber = 57	1 Percent	= 92.54%		1	894	1.0%
IRISTR	90.1%	\$9,4%	90.1%	54.5%	40.1%	1.236	17.4%	L.P.s.
KIERBL	<u>95.3%</u>	95.3%	95.0%	70.9%	11.9%	1.24	6.134	2.28
NCTRER	69.8%	69.4%	69.4%	52.2%	22.4%	1.3%	10.8%	8.296
NTPBSI	<u>88.7%</u> e	<u>SS.196</u>	88.5%	<u>67.6%</u>	32.2%	2.055	2.622	6.49a
NTPHIS	92.3%	92.1%	92.1%	73.8%	32.2%	2.396	12.6%	7.3%
ISSCAN	61.6%	61.4%	61.6%	45.9%	72.1%	0.395	7.2%	9.095
ISSMIC	76,7%	76,7%	76,7%	42,796	48.7%	0.1%	10.7%	13.386
ISSSTY	90.6%	90.196	90.6%	72.6%	64.6%	3.494	16.6%	7.296
TOXCST	90.0%	\$9.4%	89.0%	13.289	18.756	0.0%	2,7%	0.355
IXCSI2	80.9%	<u>80.8%</u>	<u>80.2%</u>	46.6%	26.4%	1.7%	10.4%	0.334
ECETOC	96.5%	95.8%	96.5%	77.5%	2.9%	6.3%	13.4%	14%
LocalL	61.9%	65.9%	65.9%	56.3%	18 344	1.9%	8.74	2.495
Local L	66,7%	<u>66,7%</u>	65.7%	57,4%	10.2%	0.024	1.00	1.9%
Bioconc	91.3%	<u>\$9.9%</u>	90.0%	70.586	23.8%	0.6%	13.8%£	1.3%
Benchma	25.496	25.4%	25,4%	21.6%	2.2%	1.124	1.784	0.5%
Benchma	37.8%	37.7%	37.7%	29.196	9.0%	1.0%	3.2h	2.8%
Bursi A	46.6%	46.6%	46.6%	36.5%	10.8%	1.125	4.2%	2,9%
EPI_AOP	85.346	85.0%	85.194	79.3%	16.0%	3.0%	15.7%	0.745
EPI_BCF	80.4%	80.4%	<u>\$0.176</u>	65.3%	23.7%	0.49	15.3%	1.2%
EPI_Bio	84.9%	84.9%	84.996	\$2.6%	0.0%	0.8%	2.6%	0.0%

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#### **BUILT-IN HEURISTICS TO DISCOVER 2D CHEMICAL STRUCTURE INCONSISTENCIES**

<b></b>							
<u>55-65-2</u> guanethidine	<u>55-65-2</u> guanethidine	<u>55-65-2</u> guanethidine	55-65-2 guanethidine				
Consensus Quality Label Majority[1:3]	Consensus Quality Label Majority[1:3]	Consensus Quality Label Majority[1:3]	Consensus Quality Label Majority[1:3]				
Structure Quality Label ProbablyOK	Structure Quality Label ProbablyOK	<u>Structure Quality</u> <u>Label</u> ProbablyOK	<u>Structure Quality</u> Label ProbablyERROR				
Automatic Classification	Initial Quality Label Assigned						
Consensus	OK						
Majority	-	ne structure that belong ne structure(s) that belo					
Ambiguous	Unknown (multiple sources)						
Unconfirmed	Unknown (single source)						
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## **NEXT STEPS**

- Substance composition support
- IUCLID5 import (substances and endpoint study records)
- Read across

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- More descriptors and models
- Tautomer enriched models (AMBIT-TAUTOMER) see poster #6)
- Metabolite generation (via SMARTCYP and AMBIT-SMIRKS package) (see poster #7)
- Improved user interface for model building
- JSON serialization of all resources
- JavaScript embeddable widgets
- Improved client libraries <u>https://github.com/ideaconsult/opentox-cli</u>
- Improved documentation and examples

https://github.com/ideaconsult/examples-ambit

• Customized distributions (also VM)

#### Downloads:

THANK YOU OUESTIONS?

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CEFIC-LRI, FP7 OpenTox, FP7 Cadaster

