## CADASTER

### CAse studies on the Development and Application of in-Silico Techniques for Environmental hazard and Risk assessment

Grant agreement no.: 212668

**Collaborative Project** 

Sub-Priority ENV2007 3.3.1.1: In-silico techniques for hazard-, safety-, and environmental risk-assessment

WP5 QSPR-THESAURUS: Web site and standalone tools for dissemination of project results

### Task 5.4 Public QSPR-THESAURUS site

Due date of deliverable: December 31, 2010 Actual submission date: December 28, 2010

Start date of project: 1 January 2009

Duration: 4 years

Corresponding authors of document: *Igor V. Tetko*<sup>1</sup>, *Stefan Brandmaier*<sup>1</sup>, *Wolfram Teetz*<sup>1</sup>

1. Institute of Bioinformatics and Systems Biology, Helmholtz Zentrum Muenchen, German Research Center for Environmental Health, Ingolstaedter Landstrasse 1, D-85764 Neuherberg, Germany (i.tetko@helmholtz-muenchen.de)

#### CADASTER

J	Project co-funded by the EU Commission within the Seventh Framework Program	ime
	Dissemination Level	
PU	Public	X
DE	Restricted to a group specified by the consortium (including the	
KE	Commission Services)	
co	Confidential, only for members of the consortium (including the	
LU	Commission Services)	

## WP 5: QSPR-THESAURUS: Web site and standalone tools for dissemination of project Results

Work Package Leader: Igor Tetko (HMGU, partner 6)

# Task 5.3 - Methods to Estimate the Applicability Domain and Experimental Design (WWW-based tools + report) (Deliverable 5.3)

#### **Overview**

The goal of this task is to make the database and tools developed within the CADASTER project publicly available to web users. The developed web site <a href="http://www.qspr-thesaurus.eu">http://www.qspr-thesaurus.eu</a> is based on the OCHEM <a href="http://www.qspr-thesaurus.eu">http://www.qspr-thesaurus.eu</a> is based on the additional tools that were developed and made available to outside-users. The overview is supplemented with displays of specific screens encountered by users when using the publicly available database and additional functionalities.

me • Database • Models •						,
odels applier browser						
Step 1. Select a model from the list						
Filter by model name:	and property name:	or by article id: M	odels visibility	". Public and	private 🛟	[refresh]
1 - 10 of 10						
MP_TAZs_remap , published by simona		predicts Melting Point using TAZ_MP_Training set (56	) MLRA	201 <mark>0-11-</mark> 12	🔓 😫 📃	8
LogVP_TAZs_remap , published by simona		predicts Vapor Pressure using TAZ_LogVP_Training set (33)	MLRA	2010-11-12		
LogWS_TAZ , published by simona		predicts Aqueous Solubility using TAZ_LogWS_Training set (49)	MLRA 2	2010-11-11	la 🖪 🗖	
LogWS_PFCs , published by simona		predicts Aqueous Solubility using PFC_LogWS_Training set (20)	MLRA	2010-11-11		8
LogVP_PFCs_remap(p4-2C) , published by simona		predicts Vapor Pressure using PFC_LogVP_Training set (35)	MLRA	2010-11-12	🔉 🗐 🛄	8
Papa_PDE_Henry new , published by wolfram		predicts Henry using Ester_Papa_LogH (7)	MLRA 2	2010-07-05	🕞 😫 🛄 (	
Papa_PDE_TM new , published by wolfram		predicts Melting Point using Ester_Papa_TM (25)	MLRA 2	2010-07-05	🕞 📳 🛄 (	8
Papa_PDE_Log_PL new , published by wolfram		predicts Vapor Pressure using Ester_Papa_Log_PL (34)	MLRA 2	2010-07-05		
Papa_PDE_Log_KOW new , published by wolfram		predicts logPow using Ester_Papa_LogKOW (20)	MLRA 2	2010-07-05	🔉 📳 🛄 (	8
Papa PDE LockOA New published by wolfram		predicts LogKoa using Ester Papa LogKOA (30)	MLRA	2010-07-05		

Figure 1. The entry page of the QSPR-THESAURUS database.

Figure 2. Publicly available models developed within the CADASTER FP7 project.

The OCHEM platform was provided as background information to the CADASTER project and it was customized to the project requirements within the framework of the project. The OCHEM itself comprises more than 100,000 lines of Java, C++, and shell script code and it was developed by a team of 5 people over three years. The majority of data collected within CADASTER project were hidden and password protected. Starting as of end of December 2010, these data are released to the public at large.

#### **Activities performed**

The main development within this task included customization of the OCHEM to the demands of the CADASTER project and addition of the required functionality. Below, we briefly summarize the main activities with a focus on the web development. Some of the activities were more deeply covered within the respective CADASTER WPs.

#### Upload of models developed within the CADASTER project

The majority of models contributed within the project are linear ones and are based on linear regression or partial least squares (PLS) approaches. We have developed a module, which accepts as input an Excel file with descriptors and coefficients of regression equations. Once the model is uploaded, it is used to predict molecules from the training and validation set(s), and several statistical parameters of the model are calculated for these sets of chemicals. The tool was tested by the project participants and a number of models developed by the QSAR Research Unit in Environmental Chemistry and Ecotoxicology of the University of Insubria (partner no 3 of the CADASTER project) were uploaded. Help on how to introduce models is provided.

While models developed using 2D descriptors could be easily reproduced, there are difficulties to do this for 3D-based model, since calculated descriptors dramatically depend on the conformation of molecules. This problem was addressed within the next task.



Figure 3. Workflow for model upload, illustrating the Sequential selection of required parameters.

#### Integration of 3D structure optimisation using MOPAC

A database for on-line optimisation of molecules using the MOPAC 7 program was developed. The MOPAC 7 program is available as <a href="http://www.cadaster.eu/mopac">http://www.cadaster.eu/mopac</a>. Users can submit a single molecule or a batch of molecules and they can download structures optimised by MOPAC. If molecules are not yet optimised, they will be automatically submitted for analysis and calculations and the user can retrieve the results later, once the calculations are finished. It is also possible to submit and retrieve molecules using the web services. The user can request the minimum energy conformation (considering or ignoring stereochemistry) as well as request the optimized conformation starting from

the given conformation. The calculations are based on a BOINC server. The structures optimized using this tool are used to calculate 3D descriptors with the CADASTER.



Figure 4. Results with 3D optimization of molecules within the MOPAC/BOINC.

#### **Similarity search**

The integration of AMBIT substructure and similarity search was performed. All molecules from the CADASTER database were uploaded to the AMBIT database. By using REST webservice technologies, the AMBIT functionality for similarity and sub-structure search was wrapped and embedded in the database. Both similarity search and substructure search are based on the SMARTS patterns. Users have the possibility to submit the requested substructures either directly as SMILES, or in several other formats. Furthermore, molecules can be also drawn in the JME Molecule editor.

#### Integration of QMRF

The (Q)SAR Model Review Format (QMRF) <u>http://www.cadaster.eu/QMRF</u> was integrated in the CADASTER database. The users can contribute the description of their models as

required by the OECD principles directly from the web site of the project. In addition to the statistical parameters available on the OCHEM web site, the users can provide several predefined parameters (R<sup>2</sup>, RMSE, Q<sup>2</sup>Loo, etc.) to document the output of both the internal and the external validation of their models. Furthermore the possibility to add any kind of graphical representation (graphs, tables, images) to support or explain the validation results as well as to describe the applicability domain of the models is provided. After filling the QMRF form and adding a new model description to the database, users receive an ID that can be used to publish the report on the <a href="http://cadaster.eu/database">http://cadaster.eu/database</a>. The data introduced to QMRF about the model's validation performed in the publications are displayed as an embedded tab of the analysed model.

The graphical representation, as well as statistical information facilitates evaluation of models and allows better estimation of the quality of prediction of new compounds.

ADAOTED ....

							** ** ** .	CADA	SIER.et
Home	REACH	CHALLENGE	Database	Partners	WP	Meetings	News	Forum	Login
Home	DASTER	EAse studies on t	he Developmen	it and Application.	of in-Silico	) Techniques, f	or Environm	nentalihazard	and Risk as tessm
SAR	Model Report	ing Format							
lispla	ying a model o	lescription							
.QSA	R identifier								
] Expand									
1.1 Q	SAR identifier (	title)							Help
Polybro	ominated Diphenyl Eth	ers, LogKOA							
1.2 Ot	ther related mo	dels							Help
Polybro Diphen	ominated Diphenyl Eth yl Ethers, TM Polybro	ers, LogKOW Poly minated Diphenyl E	brominated Diph Ethers, Henry	enyl Ethers, Log_Pl	- Polybromi	nated			
1.3 Sc	oftware coding	the model							Help
	Name:	UR	L:	Description:		Contact:			
	OBY - DIGS (Ver. 1.0	http://www.tal	ete.mi.i						

```
3.Defining the endpoint - OECD Principle 1
```

[+] Expand

Figure 5. CADASTER implementation of the QMRF form.

#### Applicability domain

.....

Methods to describe the applicability domain as developed by IDEA (partner no. 7 of the CADASTER project) were incorporated and made available within the database: IDEA AD. The implementation of IDEA AD is based on applicability domain algorithms, as indicated in Table 1. They are implemented as Web REST services, compliant to the OpenTox Application Programming Interface 1.1 [4,5].

Table 1.		
Name	Web service location	Туре
Leverage	http://apps.ideaconsult.net:8080/ambit2/algorithm/le	Descriptor
	<u>verage</u>	based
Descriptor ranges in	http://apps.ideaconsult.net:8080/ambit2/algorithm/p	Descriptor
transformed PCA space	<u>caRanges</u>	based
Euclidean distance	http://apps.ideaconsult.net:8080/ambit2/algorithm/di	Descriptor
	<u>stanceEuclidean</u>	based
City block distance	http://apps.ideaconsult.net:8080/ambit2/algorithm/di	Descriptor
	<u>stanceCityBlock</u>	based
Mahalanobis distance	http://apps.ideaconsult.net:8080/ambit2/algorithm/di	Descriptor
	<u>stanceMahalanobis</u>	based
Non parametric	http://apps.ideaconsult.net:8080/ambit2/algorithm/n	Descriptor
density estimation	paramdensity	based
Hashed fingerprints	http://apps.ideaconsult.net:8080/ambit2/algorithm/f	Structure
Tanimoto distance	<u>ptanimoto</u>	based
Hashed fingerprints	http://apps.ideaconsult.net:8080/ambit2/algorithm/f	Structure
number of missing bits	pmissingfragments	based

The algorithm AD service is used to create the AD model, specific to the training set. The model then becomes available as an OpenTox Model service, with unique URL, e.g. <a href="http://apps.ideaconsult.net:8080/ambit2/model/2443">http://apps.ideaconsult.net:8080/ambit2/model/2443</a>. The AD model can be estimated by using HTTP POST operation with dataset\_uri parameter, pointing to the dataset to be estimated. The result of the POST operation is an URL of a new Dataset, containing the result.

#### Implementation of experimental design methods

The approaches for optimal design were implemented on the web site of the project. This included implementation of the traditional D-Optimal design and newly proposed within the project PLS-optimal design. For both approaches, preliminary measured values can be taken into consideration. These preliminary values are obligatory for the PLS-based approach and can be either measurements from a literature research or newly measured values from a lab. To use this feature, users should create a molecule basket with measured values of the property, for which the experimental design should be performed. In case of the D-Optimal design, the maximum diversity set is selected in the descriptor space (represented by principal components) while in case of the PLS-Optimal design, the selection is based on latent variables derived from a PLS model. The results of this experimental design are depicted as a clickable 2D-plot using principal components or the latent variables. Compounds are discriminated into three different groups, represented by different colours. The first group contains all compounds for which a preliminary

measured value was available, the second one contains all molecules the have been selected for testing and the last group contains all other molecules.

on Max - Not leased g in create account	CADASTERS C	Ase studies on the Development and Application	of in Silco Techniques for Environmental hazard and Reik
e • Database • Models •			
perimental design			
tolecules to be predicted (required): Cadaster xperimental set (required for PLS only): ExpD	ED2		
ethod: I D-Optimal design I PLS-Optimal design			
umber of compounds to select: 10			
Next>>			
		1	
		1	
		×	
have Net Instead	ACADASTER		AND THE REAL
	in that		
me, Dear Mr.teetz! 🖂 (6) My Account Logou	n 00 - y 4 CA	se studies on the Development(and/Application-	ot in Suico, Lechniques, for environmental nazard, and Russias
me, Dear Mr.teetz! ⊠ (6) My Account Logo s v Database v Models v	n <u> </u>	se studies on the Development/ind/Appacation-	or; in, success considers, too environmental nazard and contains
me, Dear Mr.teetz! ⊠ (6) My Account Logou a v Database v Models v Nodels r lef editor	n <u> </u>	se studies on the Development/Add/ApplaChoon	of in_Suice/16Changes for a netroincentarioazated teoretisate
me, Dear Mr.teetz! ⊠ (6) My Account Logos a v Database v Models v Kel editor mode template and training set	a <u> </u>	se studies on the late inforced in dry politing.	er in Suicoy (contraptes for a normanization for a longer set
me, Dear Mr.teetzi 🖂 (6) My Account Logou • Database • Models • el editor model temptate and training set : experimental design - results		se studies on the late inforced in dry polytices.	of in Suico, Leonages for <u>Environmental</u> hazard <u>in Joura</u> is
me, Dear Mr.teetzi 🖂 (6) My Account Logou • Database • Models • iel editor model template and training set sperimental design - results		se studies on the L <mark>evel of proceedings of proceedings</mark>	of in Suico, i conseques for <u>the</u> crossing stationary and in <u>poss</u>
me, Dear Mr.teetz! 🖂 (6) My Account Logor > Database - Models - kel editor model template and training set. sperimental design - results		se studies on the late inforced in driving a	er in Suico, Leonneges torten vironnentarbazard 16 geragis
me, Dear Mr.teetz! 🖂 (6) My Account Logor • Database • Models • tel editor mode template and training set: • • • • • • • • • • • • • • • • • • •	сн	se studies on the late inforced in driving the second states of the	of in Suico, (consequentor de portoning number and in portants
me, Dear Mr.teetz! 🖂 (6) My Account Logou • Database • Models • Kel editor model temptate and training set: • • • • • • • • • • • • • • • • • • •		se studies on the Bereinforced/ind/Apparitment	of in Suico, Leonages for <u>Environmental</u> nazard <u>in gena</u> ts
me, Dear Mr.teetzi 🖂 (6) My Account Logou		se trudies on the Lare Unipercentified Appartment	of in Suico, Leonages for <u>Environmental</u> nazard <u>in gena</u> ts
me, Dear Mr.teetzi ⊠ (6) My Account Logou >> Database > Models > el editor model template and training set coperimental design - results		se trudies on the Large upper of the d'Appartments	of in Suico, Leonages for <u>Environmental</u> nazaro, <u>in priva</u>
me, Dear Mr.teetzi ⊠ (6) My Account Logor >> Database > Models > el editor model template and training set coperimental design - results 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0		se trudies on the Law Unpercepting Appartments	of in Suico, Leonages for <u>Environmental</u> nazaro <u>in priva</u>
me, Dear Mr.teetz! ⊠ (6) My Account Logor > Database × Models × kel editor roodet template and training set: coperimental design - results 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0		se trudies on the Bereinforced/ind/Appartment $S \rightarrow S \rightarrow CH_3$	of in Suico, Leonages for <u>Environmental</u> nazato <u>in priva</u>
me, Dear Mr.teetz! ⊠ (6) My Account Legen > Database × Models × kel editor roodet template and training set: sperimental design - results		$s = trudies on the Bereinforce d^{1}hd^{2}hppartment$	of in Suice, Leennages for <u>Environmental</u> hazard <u>in genaut</u>
me, Dear Mr.teetzl ⊠ (6) My Account Logou > Database × Models × kel editor roodet template and training set: sperimental design - results		s = trudies on the Bereinforce different ind Appartments +	of in Suico, Leonages for <u>Environmental</u> hazard <u>in perse</u> t
me, Dear Mr.teetzl ⊠ (6) My Account Logou • Database • Models • tel editor model template and training set: xperimental design - results • • • • • • • • • • • • • • • • • • •		s ender on the Bereinforce $d^{1}$ in $d^{2}$ pparticupations. $\begin{array}{c} s \\ - &$	of in Suice, Leanning to the Consequence of the Suice, Leanning the Sui
me, Dear Mr.teetzl ⊠ (6) My Account Legen > Database × Models × Kel editor roodet template and training set:		s endes on the Bereinforce ind Appartments $- S + CH_3$	of in Suice, Leanning to the Consequence of the Suice, Leanning the Sui
me, Dear Mr.teetzl ⊠ (6) My Account Logou • Database • Models • Sel editor remode template and training set: • • • • • • • • • • • • • • • • • • •		s endes on the Bereinforce ind Appartments $G_{H_3}$	of in Suice, Leanning to the network of the second s

Figure 6. Experimental design workflow integrated in QSPR Thesaurus site.

#### **Descriptor mapping**

The different software tools (including different versions) calculate different descriptors. The absence of descriptors may not allow the reimplementation of models. In order to solve this problem the descriptors mapping tool was developed. It allows uploading the calculated descriptors together with molecules and calculates the best mapping between the uploaded descriptors and the descriptors available in the database. The user can verify the quality of calculated mapping and use it instead of the original descriptors. In case there is 100% mapping of old and new descriptors, the mapping can be immediately

accepted. In other cases, some additional analysis can be used to decide whether such mapping is adequate or not.

#### **Conclusion and activities foreseen**

The goals and expected developments within this WP were fully achieved. The site is functional and has already been used to host several models developed within the project by CADASTER partners.

Several suggestions from project partners are under implementation now. This includes:

#### 1) calculation of models by providing external descriptors

2) storage of predicted values

Both these requirements will allow publishing of models, for which descriptors are absent in the database. The external descriptors can be those calculated by programs absent at the web database (i.e., those that could not be remapped) of the project as well as experimental physico-chemical properties of molecules, in case some models are based on them. The user will be requested to introduce such descriptors when applying his/her model to new data. The second feature will allow avoiding the first step, in case the predicted values for analyzed molecules were already uploaded to the database.

Several other enhancements with respect to display of model results are also planned. This includes better description of model results (i.e., explanation of axes of plots, visualization of the full regression equation, calculation of several other applicability domains) as requested by the project participants.