

Integrating Predictive Toxicology Model Development

SMi ADMET Conference

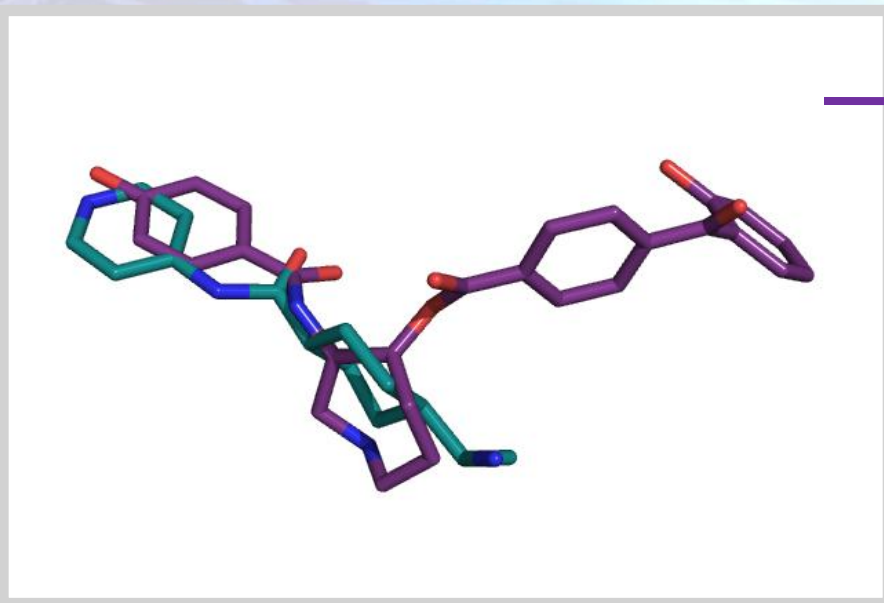
7,8 July 2010

London, UK

Barry Hardy (Douglas Connect)

Collaborative Predictive Toxicology Challenge

Input Structure



VO

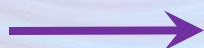


Out - Toxic or Not?

- ☐ LD50
- ☐ Liver Toxicity
- ☐ Secondary Metabolites
- ☐ Bioavailability
- ☐ Mutagenicity
- ☐ Carcogenicity
- ☐ Reproductive Toxicology
- ☐ Skin Irritation
- ☐ Aqua Toxicity
- ☐ Combined predictions for arrays of multiple end points



Driver



Increasing demands on industry to satisfy safety evaluation and risk assessment required by REACH legislation. (Over 142k cmpds registered).

Step 1: Search
Select structure(s)

Step 2: Verify structure
Verify structure

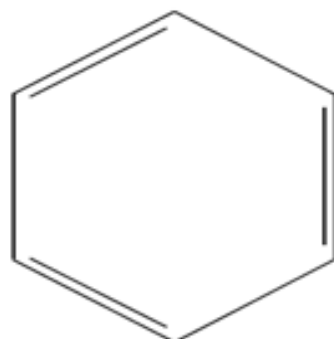
Step 3: Models
Select prediction models

Step 4: Estimate
Estimate

Step 5: Results
Display results

This page lists your ToxPredict workflow results for the structure(s) you have selected and the model prediction(s) you have chosen to run. You could also retrieve the ToxPredict report in various other formats, e.g. [SDF](#), [CML](#), [SMI](#), [PDF](#), [CSV](#), [ARFF](#), [RDF/XML](#) or [RDF/N3](#).

Download as 



CAS RN
EINECS
IUPAC name
Synonym

71-43-2
200-753-7
benzene
(6)annulene; benzine; Benzol; Benzolene;
bicarburet of hydrogen; carbon oil; Coal naphtha;
cyclohexatriene; mineral naphtha; motor benzol;
nitration benzene; Phene; Phenyl hydride;
pyrobenzol.

Synonym
Synonym
Synonym
Quality label

21742.0
Benzene
benzene
OK

MolecularWeight  **MolecularWeight**

MW

78.1112

Development of Strategies for Interoperable Resources & Applications in Predictive Toxicology



Eliminate
traditional
circus acts,
animals



Create
theatrical
themes,
storylines,
new acts



Reduce
dangerous acts,
traditional
humour,
transport costs

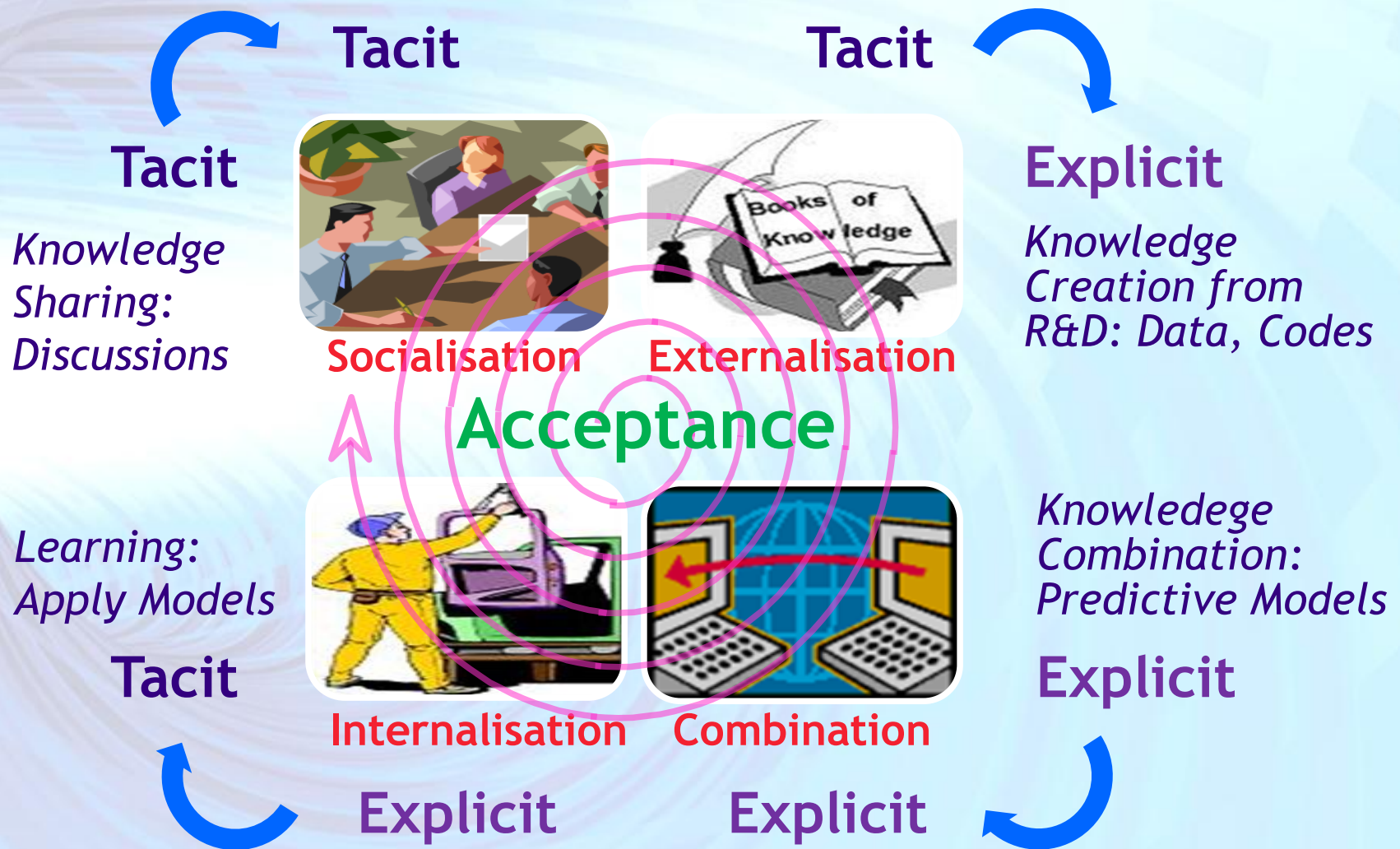
**Blue
Ocean**

Raise
tent standards,
artistic
sophistication,
ticket prices!



Based on Blue Ocean Strategy,
Kim & Mauborne 2006

SECI Model for Knowledge Management



Complexity Context

Non Repeatable
Adaptative, Patterns,
Filters

Sense
Making for
Emergent
Practice

Leadership
Novel
Practice

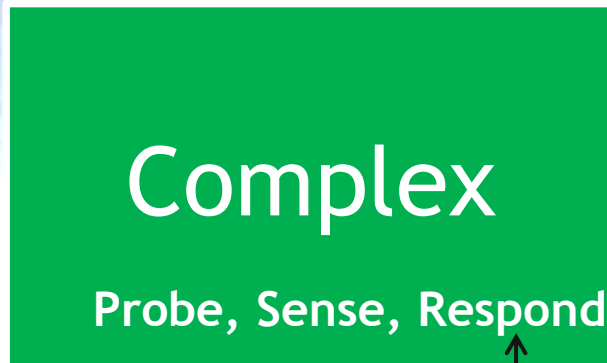
Lack of Cause & Effect, Stability-focused
Intervention, Crisis Management

Complex Cause & Effect
Systems Thinking, Analysis

Processes
Good
Practice

Procedures
Best
Practice

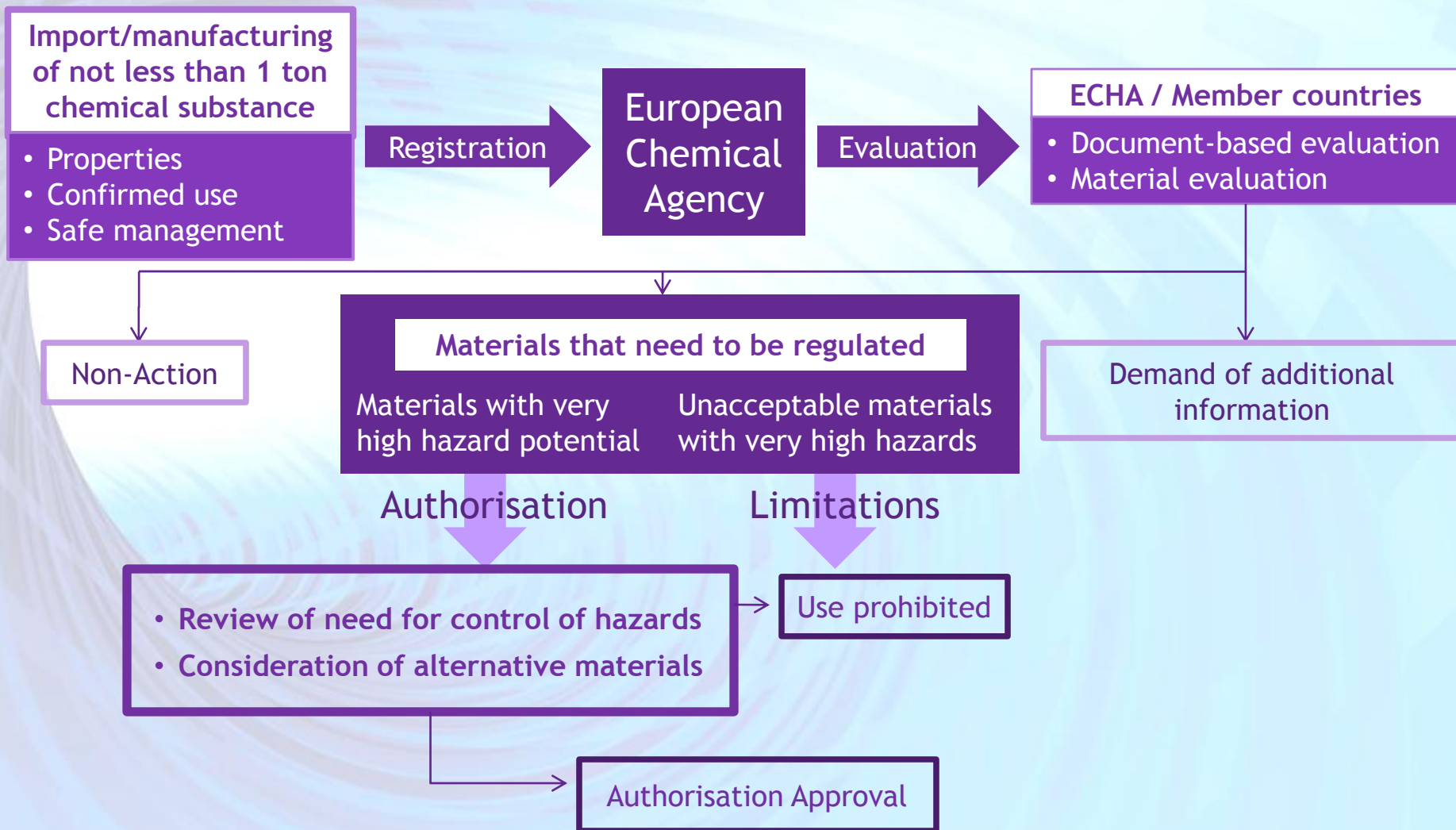
Cause & Effect
Repeatable, SOPs



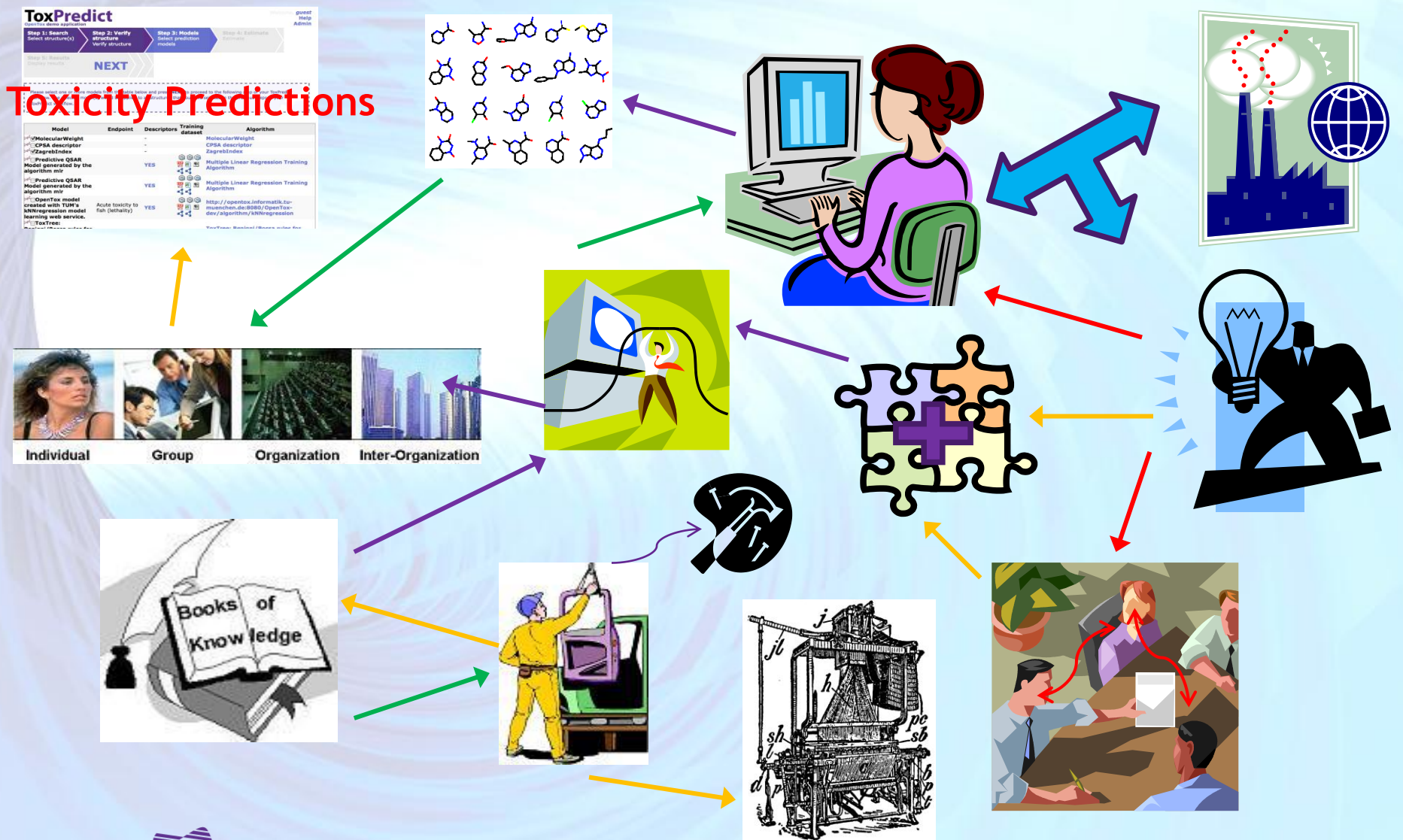
REACH



REACH Registration



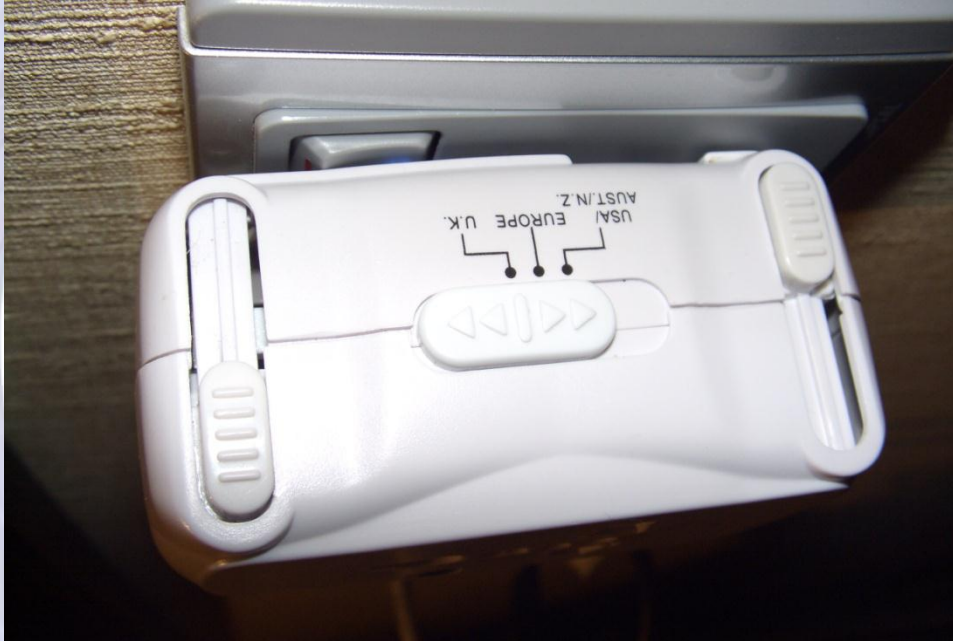
Accelerating Knowledge Flows in Predictive Toxicology



Challenges to Integrated Resources & Applications

- Database silos
- Missing information
- Varying quality
- Hard to integrate data
- Hard to integrate models
- No common framework
- Lack of standards
- Lack of validation
- Complex subject
- Application difficult
- Lack of transparency
- Interdisciplinary collaboration

Absence of Interoperability creates Problems



Adaptor Challenge in Jeddah, 2008

Interacting Components create Solutions



Adaptor Solution in Jeddah, 2008

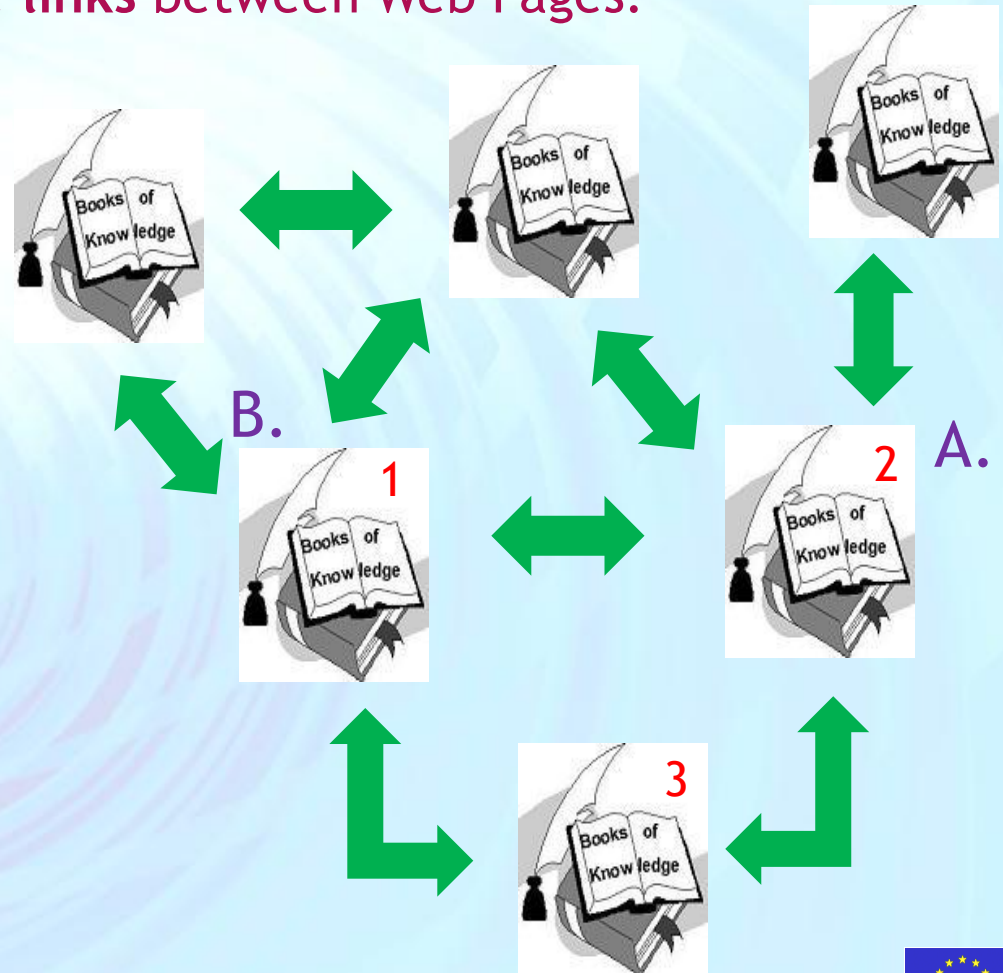
Value is in Linking

The key idea of Google's founders in creating their search engine:
There is useful knowledge in the **links** between Web Pages.

Page Ranking

A page is ranked higher in a search if:

- A. it has more connections to it than other pages
- B. the pages connecting to it have higher ranking themselves



Linked Data enables Knowledge Creation, Combination and Analysis

Linked Data is a term used to describe the exposing, sharing, and connecting of data on the Semantic Web using:

URIs a generic means to identify entities in the world

HTTP a simple yet universal mechanism for retrieving resources

RDF a generic graph-based data model with which to structure and link data

Linked Data needs:

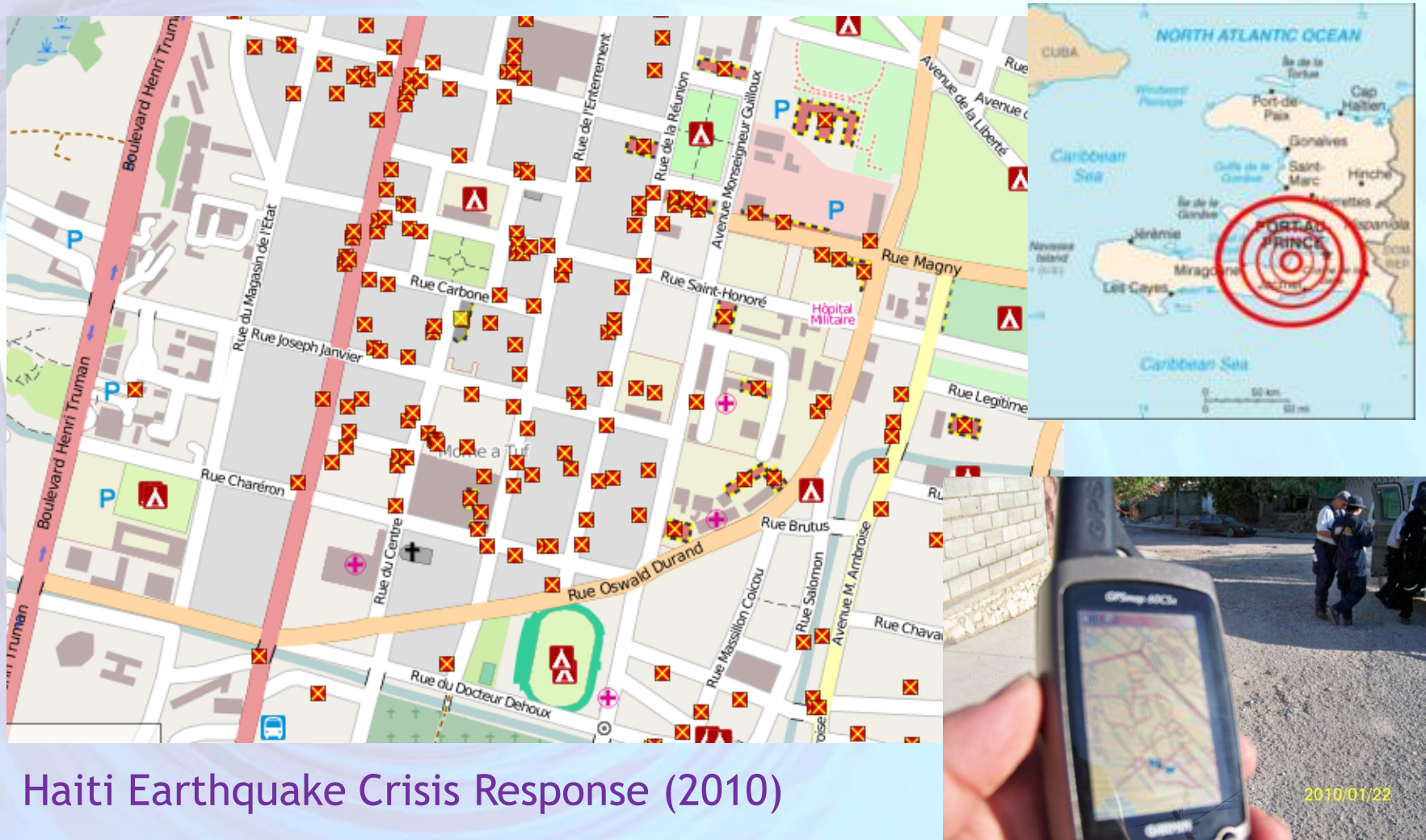
1. Provision of a **URI** that describes a Data Resource
2. Use of **HTTP** to retrieve useful data from the **URI**
3. A Data Format described with standardised semantics (so relationships are enabled) e.g. **RDF**
4. Data should provide links to other Data (through **URIs**)

Linked Data approach can also be applied to other resource types e.g., for algorithms or models as done in OpenTox...



DBpedia = Linked Data approach applied to Wikipedia

Solution created by Linked Open Data, Web Applications and Crowdsourcing



Haiti Earthquake Crisis Response (2010)

wiki.openstreetmap.org

OpenTox is an Integrating Framework

A diagram on the left side of the slide consists of three concentric semi-circles, each with a different shade of purple. The outermost semi-circle is the darkest, the middle one is a medium purple, and the innermost one is the lightest. These semi-circles are positioned to the left of a table, with their right edges aligned with the table's columns. The table has three rows, each corresponding to one of the semi-circles. The first row is associated with the darkest semi-circle, the second with the medium purple one, and the third with the lightest one. The table's first column contains the names of the components: 'Framework', 'Diverse Access', and 'Interoperability'. The second column contains bulleted lists of details for each component.

Framework

- Toxicity Data (Linked)
- *in silico* models
- Validation & Reporting
- Interpretation aids

Diverse Access

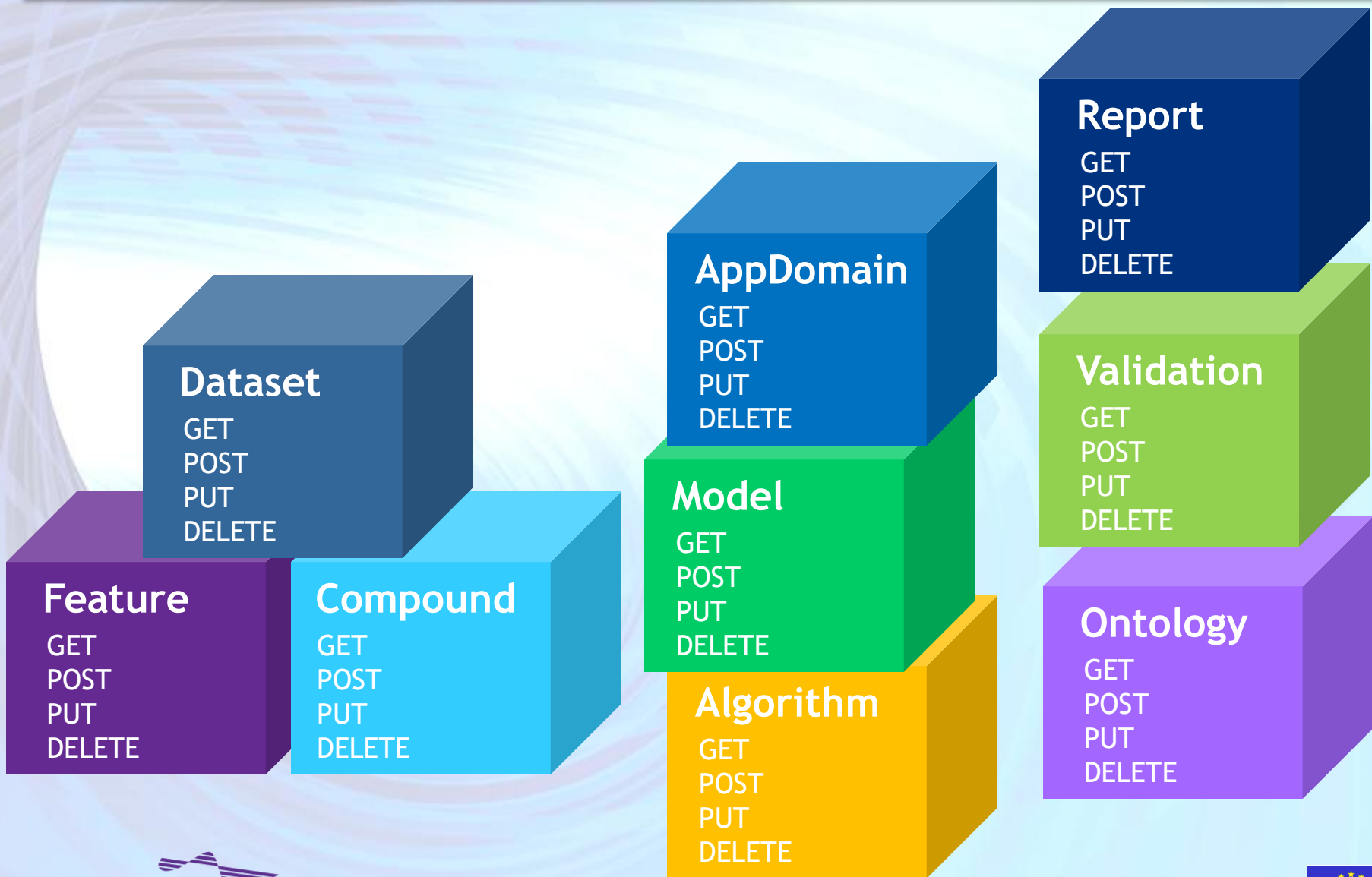
- Toxicolog, Biolog, Chem - ists
- Computational Scientists
- Interfaces for new algorithm development & integration

Interoperability

- Promote Standards
- Core Open Source Components
- Support Ontologies & Integration of Multiple Resources

	OECD Principle	OpenTox addresses Validation Principles by...
1	Defined Endpoint	providing a unified source of well defined and documented toxicity data with a common vocabulary
2	Unambiguous Algorithm	providing transparent access to well documented models and algorithms as well as to the source code
3	Defined Applicability Domain	integrating tools for the determination of applicability domains during the validation of prediction models
4	Goodness-of-fit, robustness and predictivity	providing scientifically sound validation routines for the determination of errors and confidences
5	Mechanistic interpretation (if possible)	integrating tools for the inference, correlation or prediction of toxicological mechanisms and the recording of opinions and analysis in reports

Overview of Application Programming Interfaces



Representational State Transfer (REST): What and Why?

What?

- Architectural style for distributed information systems on the Web
- Simple interfaces, data transfer via **hypertext transfer protocol (HTTP)**, stateless client/server protocol
 - GET, POST, PUT, DELETE
- Each **resource** is **addressed** by its own **web address**

Why?

- **Lightweight** approach to **web services**
- **Simplifies/enables** development of **distributed systems**
- (More or less) language independent/installation-free

OpenTox Interface Definition Example

Description	Method	URI	Parameter	Result	Status codes
Get available feature URIs for a compound	GET	/compound/{cid}/feature	?feature_uris[]="URI to features" (optional)	Returns representation of the features as uri-list or RDF All available features are returned, if no parameter is specified.	200,404,503
Create a new feature value	POST	/compound/{cid}/feature	?feature_uri="URI to feature" (mandatory, single feature)&value=the_value	URI of the compound with the new feature, e.g. /compound/{id}?feature_uris[]=the-new-feature	200,400,503
Update a new feature value	PUT	/compound/{cid}/feature	?feature_uri="URI to feature" (mandatory, single feature)&value=the_value		200,400,404,503
Delete specified features from the compound	DELETE	/compound/{cid}/feature	?feature_uris[]="URI to features" (optional)		200,400,404,503

www.opentox.org/dev/apis

Ontologies: What and Why?

What?

- Formal, shared conceptualization of a domain

Why?

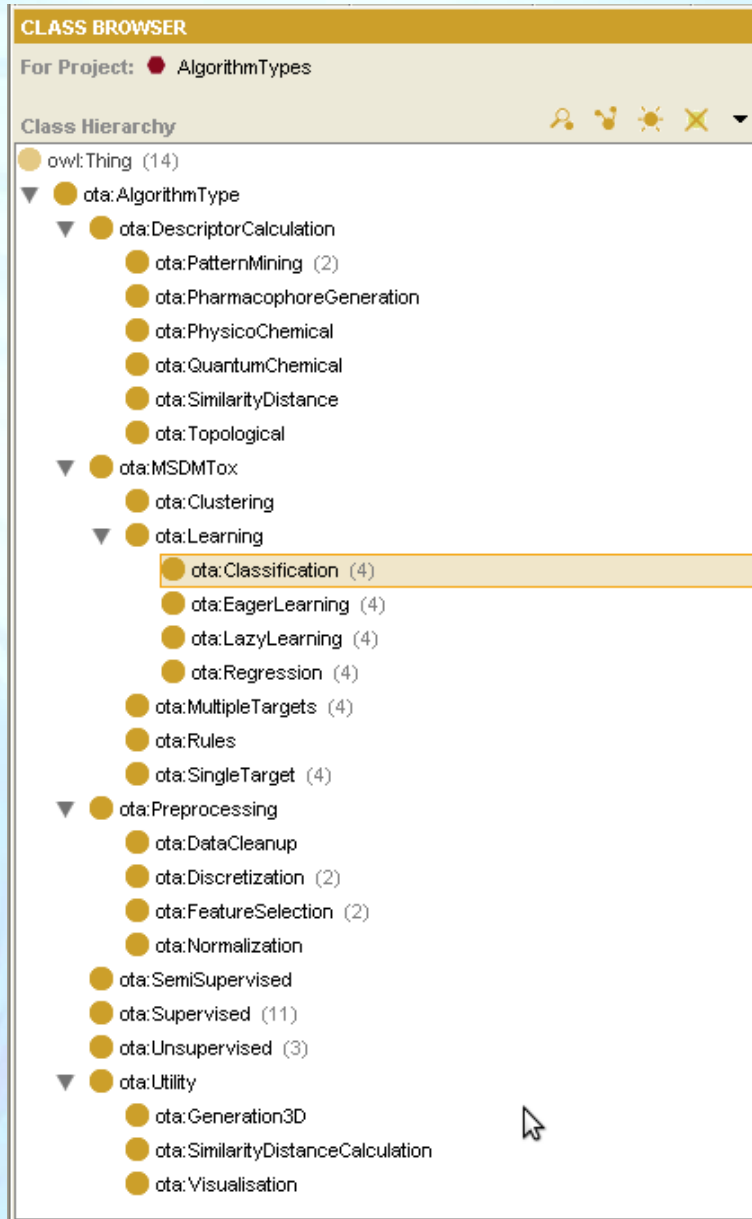
- Distributed services **need** to be able to “talk to each other”, i.e. have a **common understanding** of endpoints, any type of property, methods, etc.



Ontologies

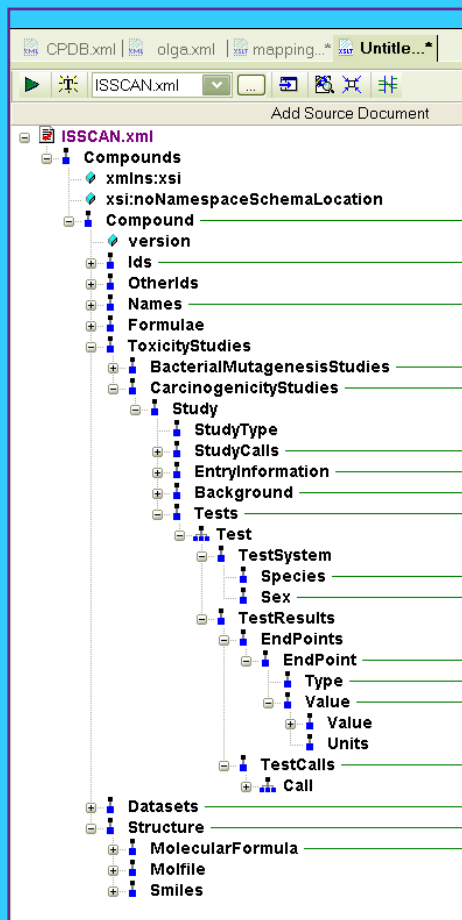
- Standards: **OWL** as representation language and **SPARQL** as query language
- There are many ongoing biological ontology projects
- Our strategy: use existing work and standards wherever possible
- However, there are new ontology needs for OpenTox applications, e.g. for algorithms, toxicological endpoints

OpenTox
Ontology Working Group



Toxicological Endpoint Ontology Development

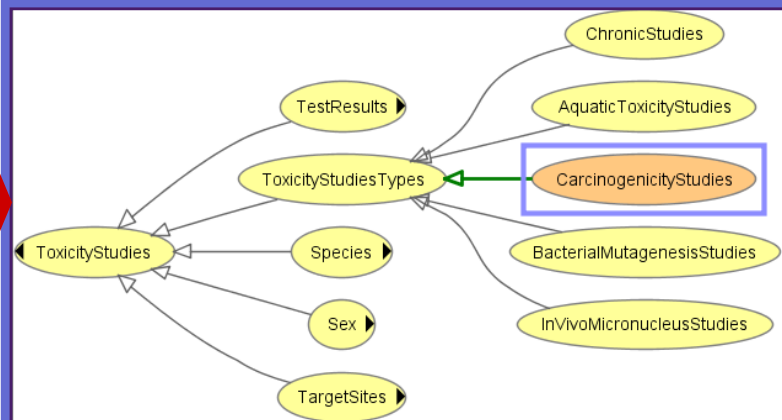
ToxML schema



Other publicly available resources:
DSSTox, GoReni (ITEM), ISSCAN ...

OpenTox Toxicological Endpoint Ontology

Ontology Development



Re-use of terms defined in
neighbouring ontologies (e.g. OBO)

Collaborative
Protégé
Environment

OpenToxipedia



Barry Hardy Log out Quicktools Site Setup Help

Site Map Accessibility Contact Data

Search Site

Home Toxicity Prediction OpenTox Blog People Partners Development OpenToxipedia
User Guidance Latest Entries A B C D E F G H I J K L M N O P Q R S T U V W
X Y Z by Categories Entries OpenToxipedia

You are here: Home » OpenToxipedia

Contents View Edit Rules Sharing History

Actions Display Add new... State: Published

OpenToxipedia

by Barry Hardy — last modified Sep 03, 2009 01:09 PM

OpenTox Community Resource for Toxicology Vocabulary and Ontology

OpenTox is supporting the creation and curation of OpenToxipedia, a community-based predictive toxicology knowledge resource. All members of the community are welcome to provide entries, suggested definition edits or additional information to entries in the resource.

OpenTox is supporting the application and development of the **ToxML** standard for representation of toxicology data, the **OECD principles for (Q)SAR model validation**, and the use of the **OECD HT** standard for regulatory reporting purposes.

OpenToxipedia provides here a Vocabulary Resource of toxicology terminology. We hope you find the resource useful and consider contributing to terms and their content.

Guidance for Vocabulary Resource entries



www.opentox.org/opentoxipedia



OpenTox: Databases

Chemical compounds - Mozilla Firefox

File Edit View History Bookmarks Tools Help

http://apps.ideaconsult.net:8180/ambit2/query/smarts?type=smiles&search=[*]OC(=O)[C@H](O)[C@H](O)[C@H](O)[C@H](O)C1CCCC1

Chemical compounds

ToxPredict TTC Depiction Datasets Chemical compounds Similarity Substructure Algorithms References Features Templates Models Ontology RDF playground Help

ambit

SMARTS Draw substructure

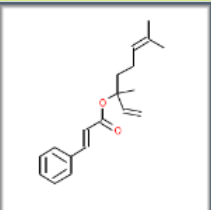
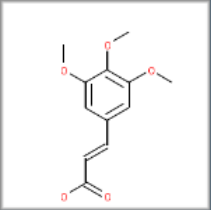
Keywords Search

Search for substructure and properties
This site and AMBIT REST services are under development!

Retrieve data

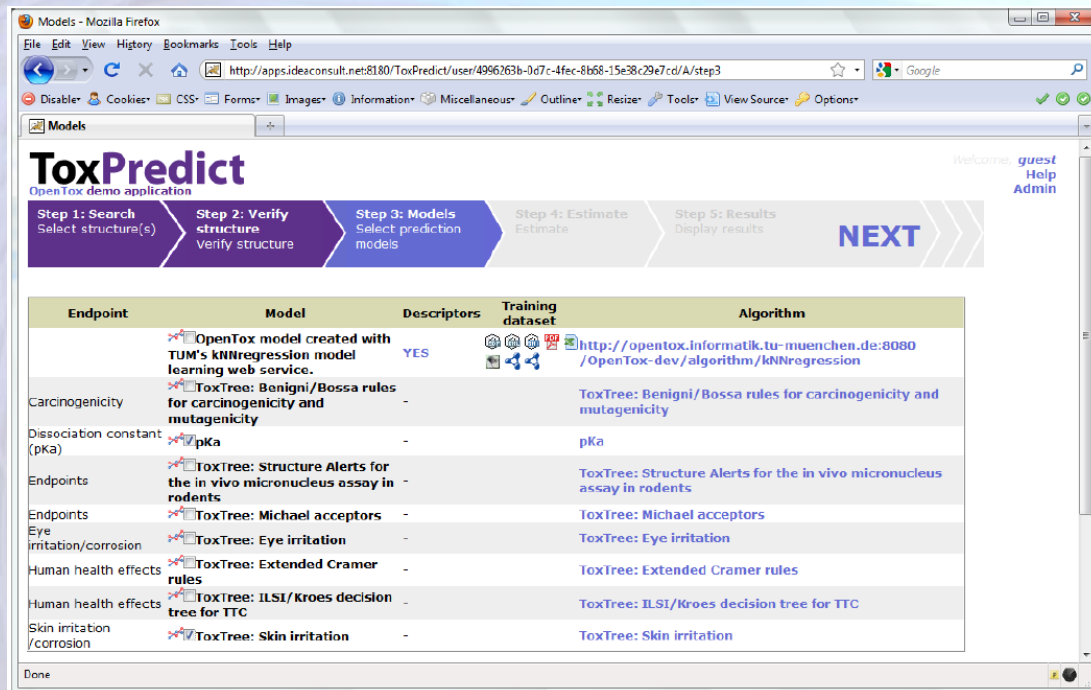
Search results SMARTS [*]OC(=O)[C@H](O)[C@H](O)[C@H](O)[C@H](O)C1CCCC1 Download as Max number of hits: 100

☐ Default
☐ Identifiers
☐ Datasets
☐ Models
☐ Endpoints
☐ All descriptors
☐ pKa
☐ Molecule size
☐ Electronic descriptors (PM3 optimized structure)
☐ Electronic descriptors (original structure)
☐ Toxtree: Cramer rules

#	Compound	ECHA REGISTRATION DATE	ECHA CasRN	ECHA EC	ECHA Names	ECHA SYNON Names	ECHA SYNON Names	ECHA SYNON Names	ECHA SYNON Names	ECHA SYNON Names	ECHA SYNON Names
1		30.11.2010	78-37-5	201-110-3	linalyl cinnamate						
2		30.11.2010	90-50-6	201-999-8	3,4,5-trimethoxycinnamic acid						

http://apps.ideaconsult.net

What you can do with it ...



ToxPredict
OpenTox demo application

Welcome, [guest](#) [Help](#) [Admin](#)

Step 1: Search
Select structure(s)


Step 2: Verify
Verify structure

Step 3: Models
Select prediction models

Step 4: Estimate
Estimate

Step 5: Results
Display results


NEXT

Endpoint	Model	Descriptors	Training dataset	Algorithm
	OpenTox model created with TUM's kNNregression model learning web service.	YES	 https://github.com/OpenTox-dev/kNNregression	http://opentox.informatik.tu-muenchen.de:8080/OpenTox-dev/algorithm/kNNregression
Carcinogenicity	ToxTree: Benigni/Bossa rules for carcinogenicity and mutagenicity	-		ToxTree: Benigni/Bossa rules for carcinogenicity and mutagenicity
Dissociation constant (pKa)	pKa	-		pKa
Endpoints	ToxTree: Structure Alerts for the in vivo micronucleus assay in rodents	-		ToxTree: Structure Alerts for the in vivo micronucleus assay in rodents
Endpoints	ToxTree: Michael acceptors	-		ToxTree: Michael acceptors
Eye irritation/corrosion	ToxTree: Eye irritation	-		ToxTree: Eye irritation
Human health effects	ToxTree: Extended Cramer rules	-		ToxTree: Extended Cramer rules
Human health effects	ToxTree: ILSI/Kroes decision tree for TTC	-		ToxTree: ILSI/Kroes decision tree for TTC
Skin irritation/corrosion	ToxTree: Skin irritation	-		ToxTree: Skin irritation

Done

Simple building of predictive toxicology applications based on well-established methods and databases

What you can do with it ...



The screenshot shows the ToxPredict web application in a Mozilla Firefox browser. The URL is <http://apps.ideaconsult.net:8180/ToxPredict/user/496263b-0d7c-4fec-8b68-15e38c29e7cd/A/step3>. The interface includes a navigation bar with steps: Step 1: Search (Select structure(s)), Step 2: Verify structure (Verify structure), and Step 3: Models (Select prediction models). Below this is a table with columns: Endpoint, Model, and Descriptors.

Endpoint	Model	Descriptors
	OpenTox model created with TUM's kNNregression model learning web service.	YES
Carcinogenicity	ToxTree: Benigni/Bossa rules for carcinogenicity and mutagenicity	-
Dissociation constant (pKa)	pKa	-
Endpoints	ToxTree: Structure Alerts for the in vivo micronucleus assay in rodents	-
Endpoints	ToxTree: Michael acceptors	-
Eye irritation/corrosion	ToxTree: Eye irritation	-
Human health effects	ToxTree: Extended Cramer rules	-
Human health effects	ToxTree: ILSI/Kroes decision tree for TTC	-
Skin irritation/corrosion	ToxTree: Skin irritation	-

Below the table is a "Done" button. To the right of the browser window is a map of Europe with five green circular markers placed in various locations: two in Northern Europe (UK/Ireland area), one in Central Europe (Germany/Poland area), one in Eastern Europe (Russia/Ukraine area), and one in Southern Europe (Spain/Portugal area).

Simple building of applications methods and

Distributed applications, integrating wide range of data, models, prediction methods

What you can do with it ...

The image displays two overlapping software interfaces. On the left is the ToxPredict web application, which includes a table of endpoints and models. On the right is the Taverna workflow system, showing a complex workflow diagram for machine learning tasks.

ToxPredict OpenTox demo application

Step 1: Search
Select structure(s)

Step 2: Verify
structure
Verify structure

Step 3: Models
Select prediction
models

Endpoint	Model	Descriptors
Carcinogenicity	OpenTox model created with TUM's kNN regression model learning web service. ToxTree: Benigni/Bossa rules for carcinogenicity and mutagenicity	YES
Dissociation constant (pKa)	pKa	-
Endpoints	ToxTree: Structure Alerts for the in vivo micronucleus assay in rodents	-
Endpoints	ToxTree: Michael acceptors	-
Eye irritation/corrosion	ToxTree: Eye irritation	-
Human health effects	ToxTree: Extended Cramer rules	-
Human health effects	ToxTree: ILSI/Kroes decision tree for TTC	-
Skin irritation/corrosion	ToxTree: Skin irritation	-

Done

Taverna Workflow

Workflow diagram showing a sequence of tasks: ask_username, title_value, message_value, choose_trasnet, choose_testset, upload_trainset, wait_for_trainset, get_features_of_trainset, calculate_descriptors, choose_prediction_feature, learn_model, wait_for_learned_model, dataset_service_value_1, apply_model_to_testset, wait_for_prediction, and result.

Simple building of
applications
methods and

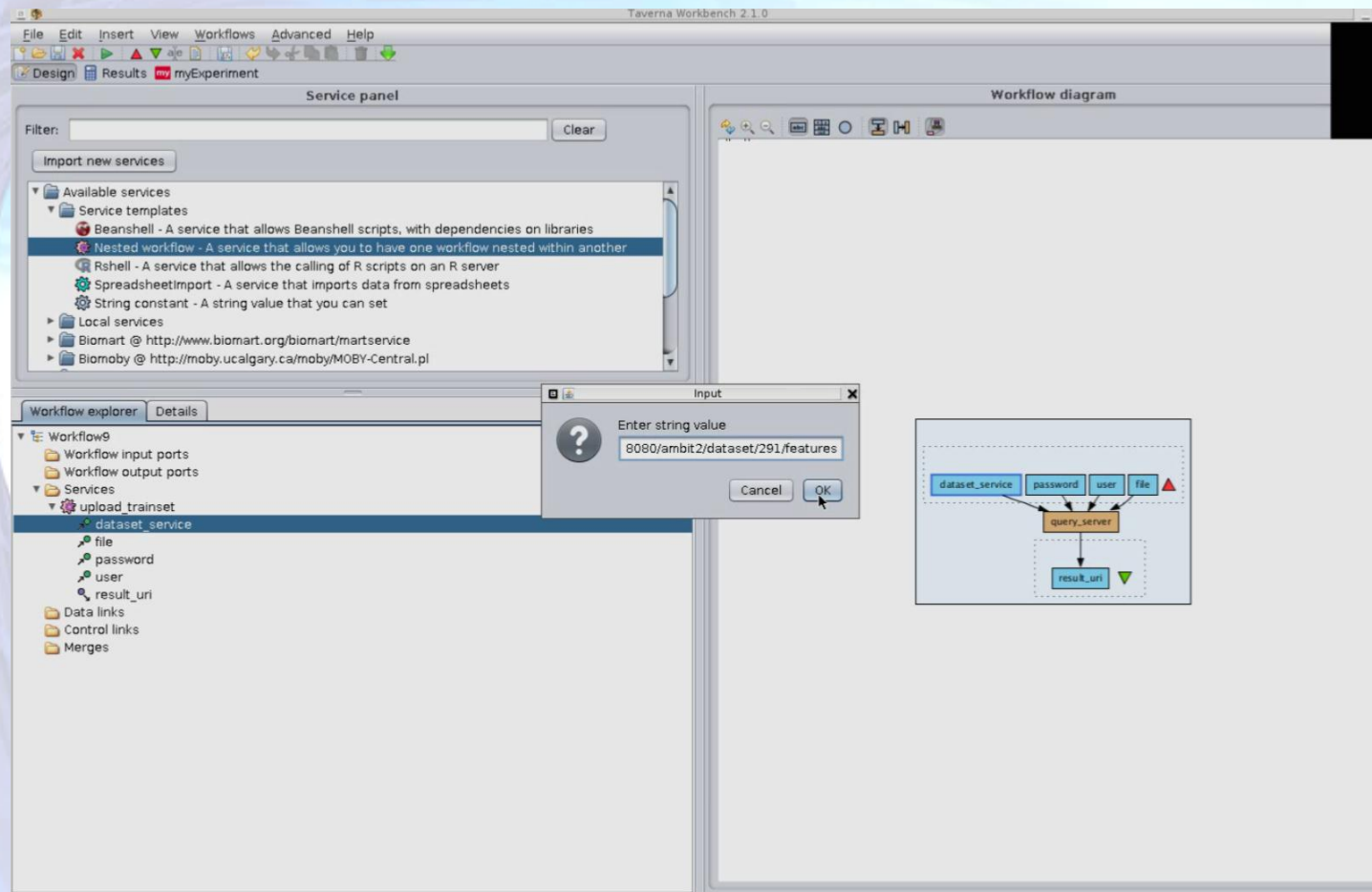
Distributed of
wide range of
methods

Integration into workflow systems for
computational biology

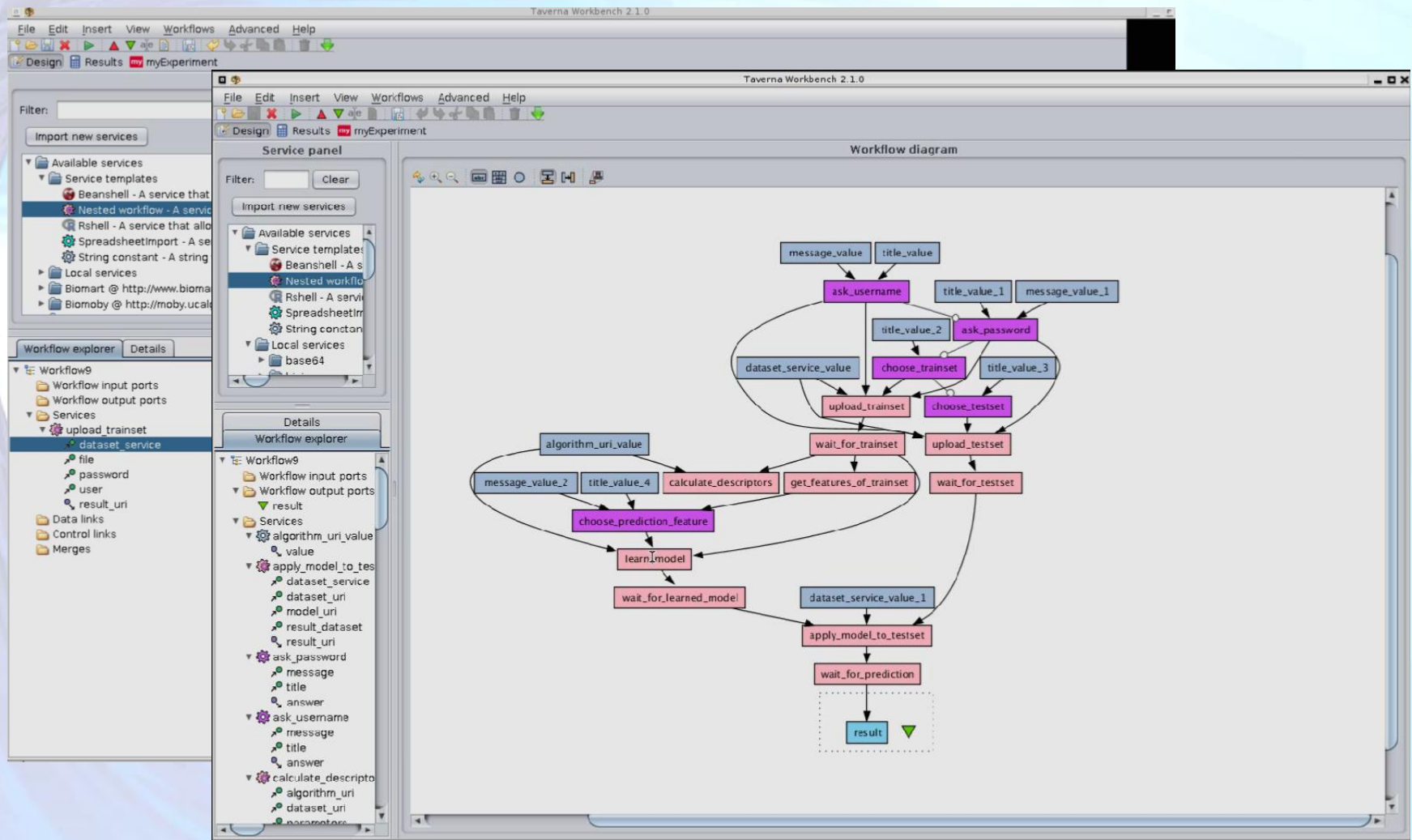
Workflows Connecting OpenTox services

- OpenTox services can be integrated into workflows of tasks using workflow systems such as Taverna
- Supports the execution of multiple services in both synchronous and asynchronous tasks
- Goal is to support the integration of distributed chemical and biological data and modelling resources in more complex applications

Taverna Workflow System & OpenTox Services



Taverna Workflow System & OpenTox Services

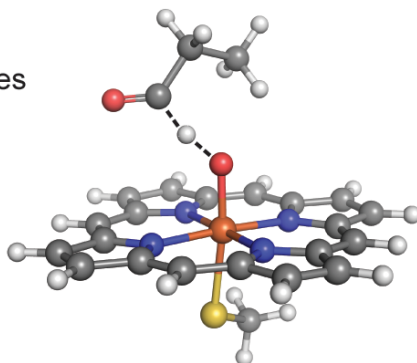


SMARTCyp Service for Predicting Metabolites

Atom Reactivity Library

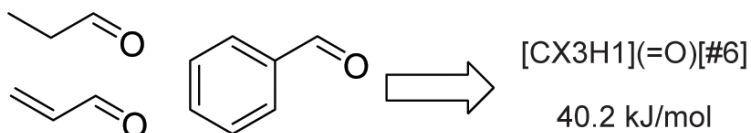
A. Calculate Quantum Chemical Reference Energies

Calculate transition state energies using density functional theory



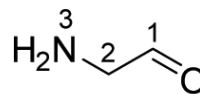
B. Define SMARTS Rules

Group calculations by fragments and calculate average energies



SMARTCyp

1. Assign Energies By SMARTS matching



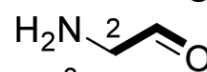
Atom	SMARTS	Energy
1	[CX3H1](=O)[#6]	40.2
2	[CX4][N]	39.8
3	[N^3][H1,H2]	54.1

2. Compute Accessibility Descriptor

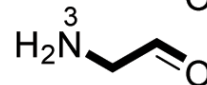
$$A_i = \text{Maxbonds}_i / \text{Maxbonds}_{\text{all}}$$



$$A_1 = 2 / 3 = 0.67$$



$$A_2 = 2 / 3 = 0.67$$



$$A_3 = 3 / 3 = 1.00$$

3. Compute Score and Rank Atoms

$$\text{Score, } S = E - 8A$$

Lowest score gets rank 1

$$S_1 = 40.2 - 8 \cdot 0.67 = 34.84$$

$$S_2 = 39.8 - 8 \cdot 0.67 = 34.44$$

$$S_3 = 54.1 - 8 \cdot 1.00 = 46.10$$

Atom 1 - Rank 2

Atom 2 - Rank 1

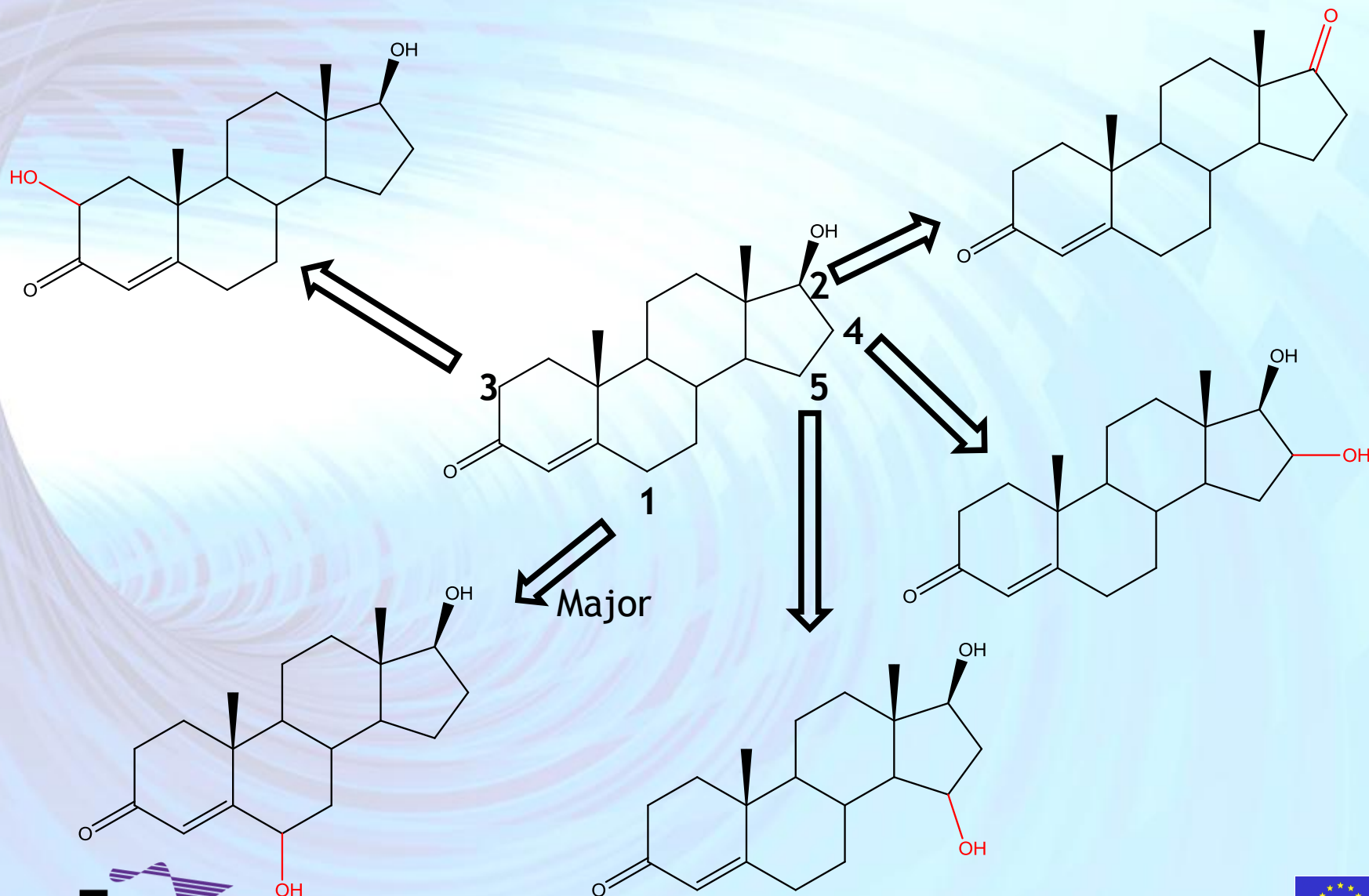
Atom 3 - Rank 3



SMARTCyp - developed by Patrik Rydberg, University of Copenhagen

www.farma.ku.dk/index.php/SMARTCyp/7990/0/

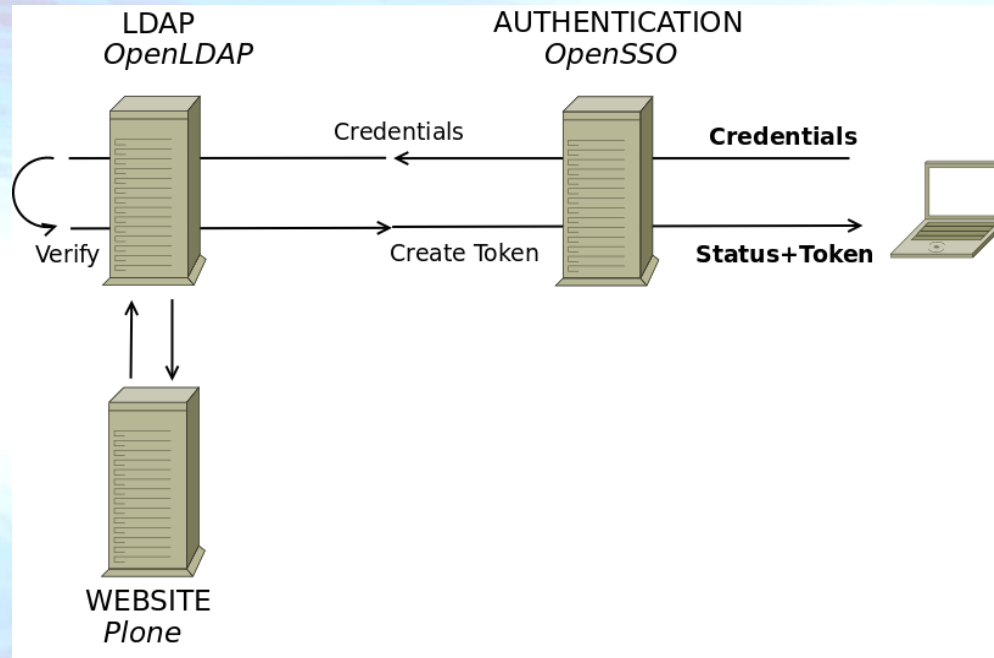
SmartCYP Prediction of Testosterone Metabolites



Controlling Access to Confidential Information

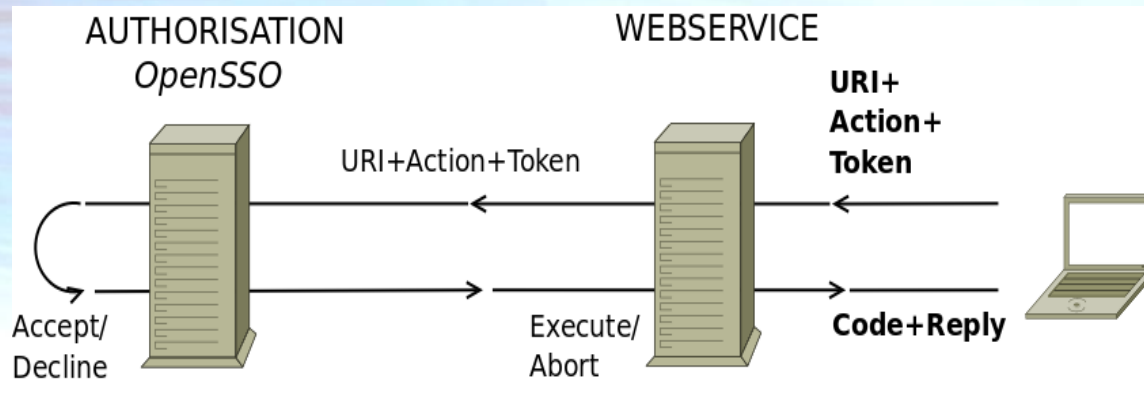
- OpenTox makes resources available through **URIs**
- OpenTox provides facilities to protect confidential information located at **URIs**. Two tasks are involved here:
 - **Authentication**: Confirming the identity of the user requesting access
 - **Authorisation**: Granting the confirmed identity access according to a set of restrictions described in policies

Authentication



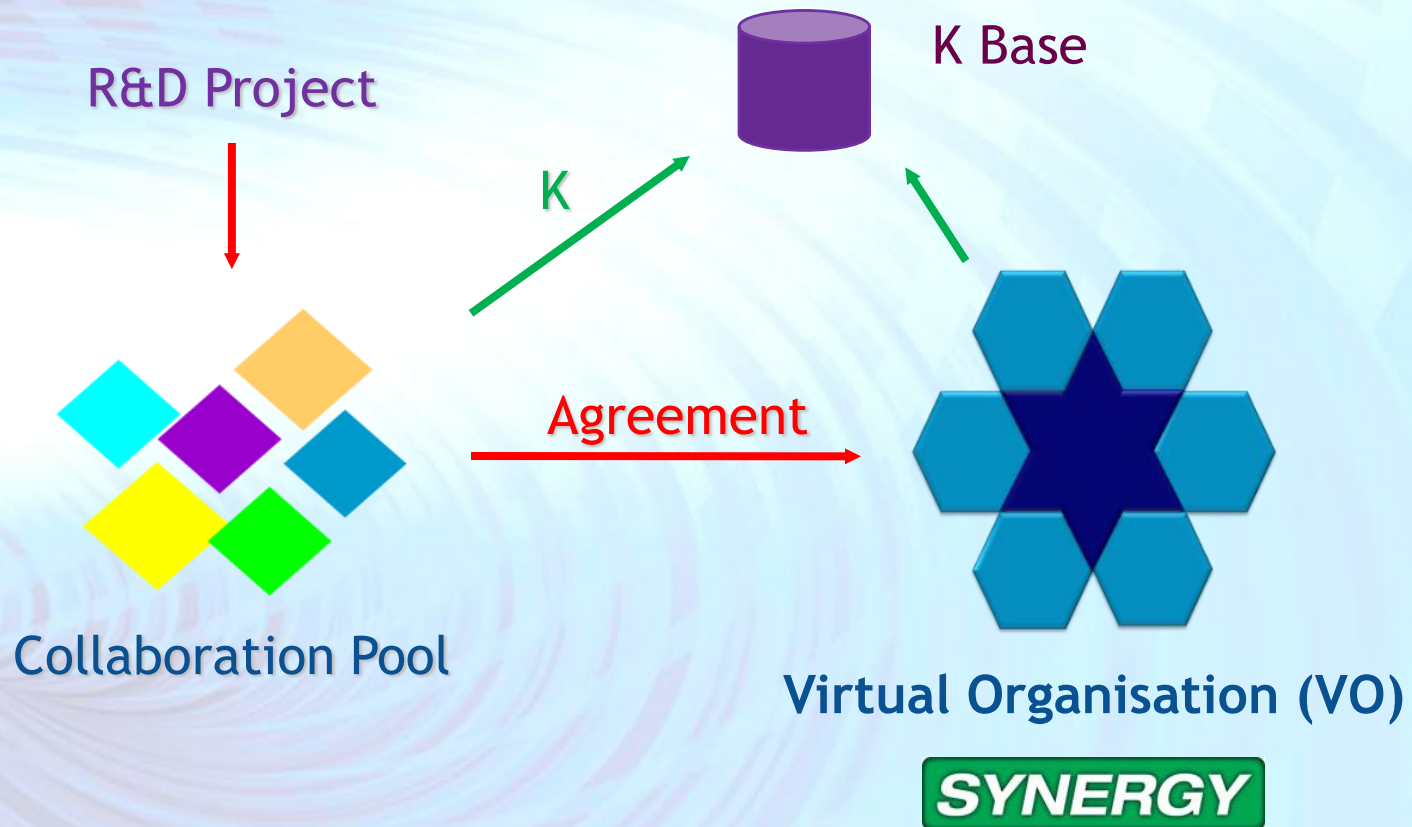
- Registered users are instantly available as potential users of OpenTox web services
- Users receive a token upon service request

Authorisation



- Tokens encode user identity
- Tokens are valid for a certain time period only (customizable)
- The triplet URI+Action+Token makes up the call to be authorised
- All messages are encrypted (SSL)
- Resource Owners create and modify policies defining access rules

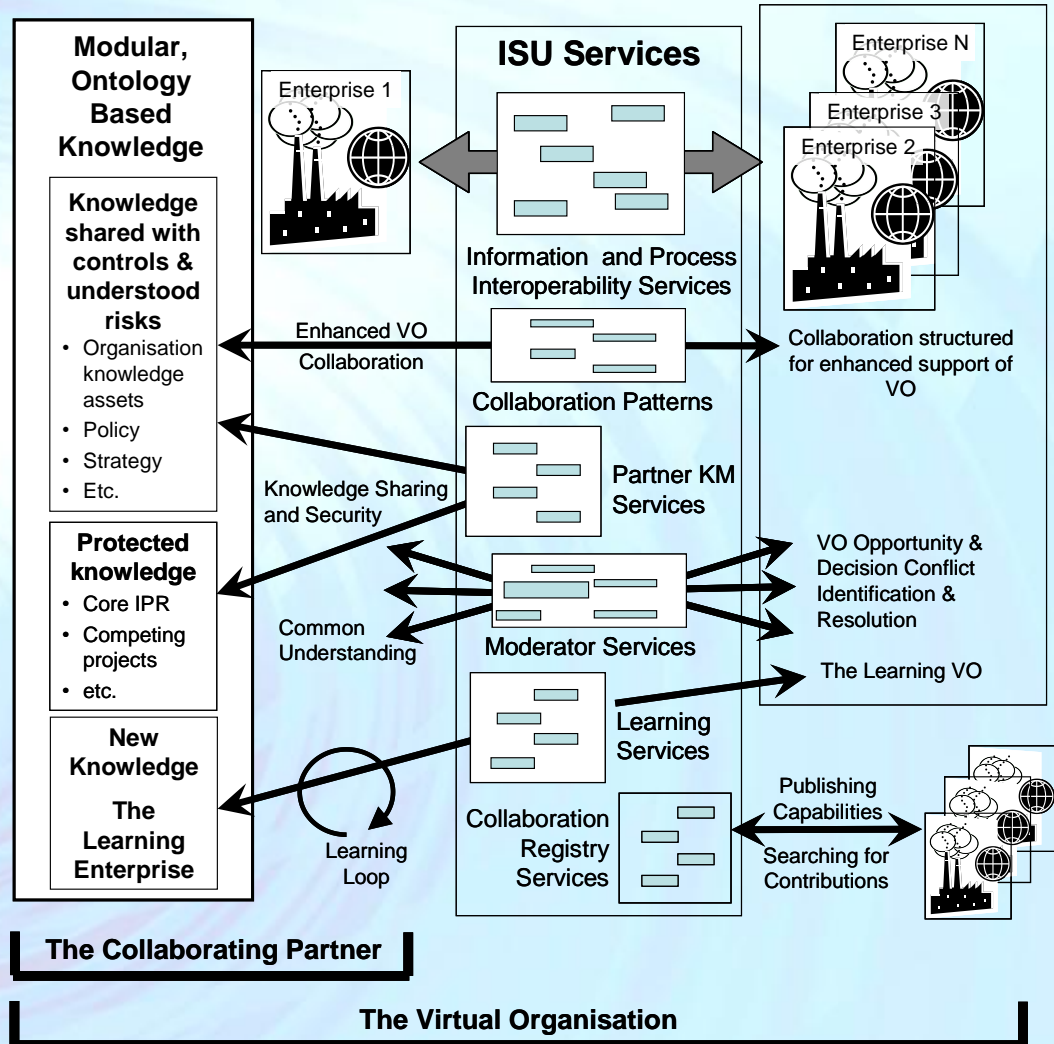
Virtual Organisation Pilots



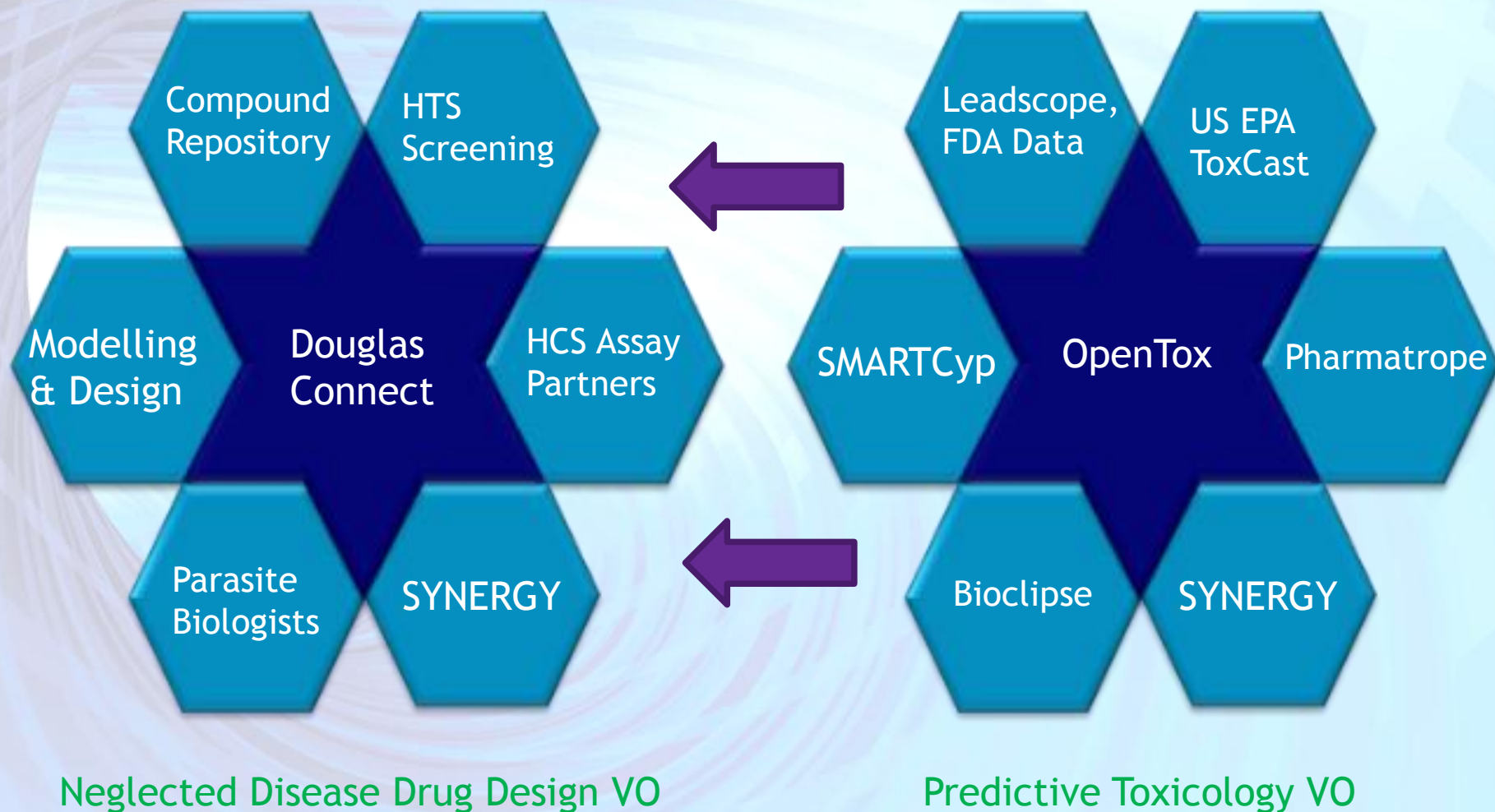
SYNERGY Collaboration Services for VOs



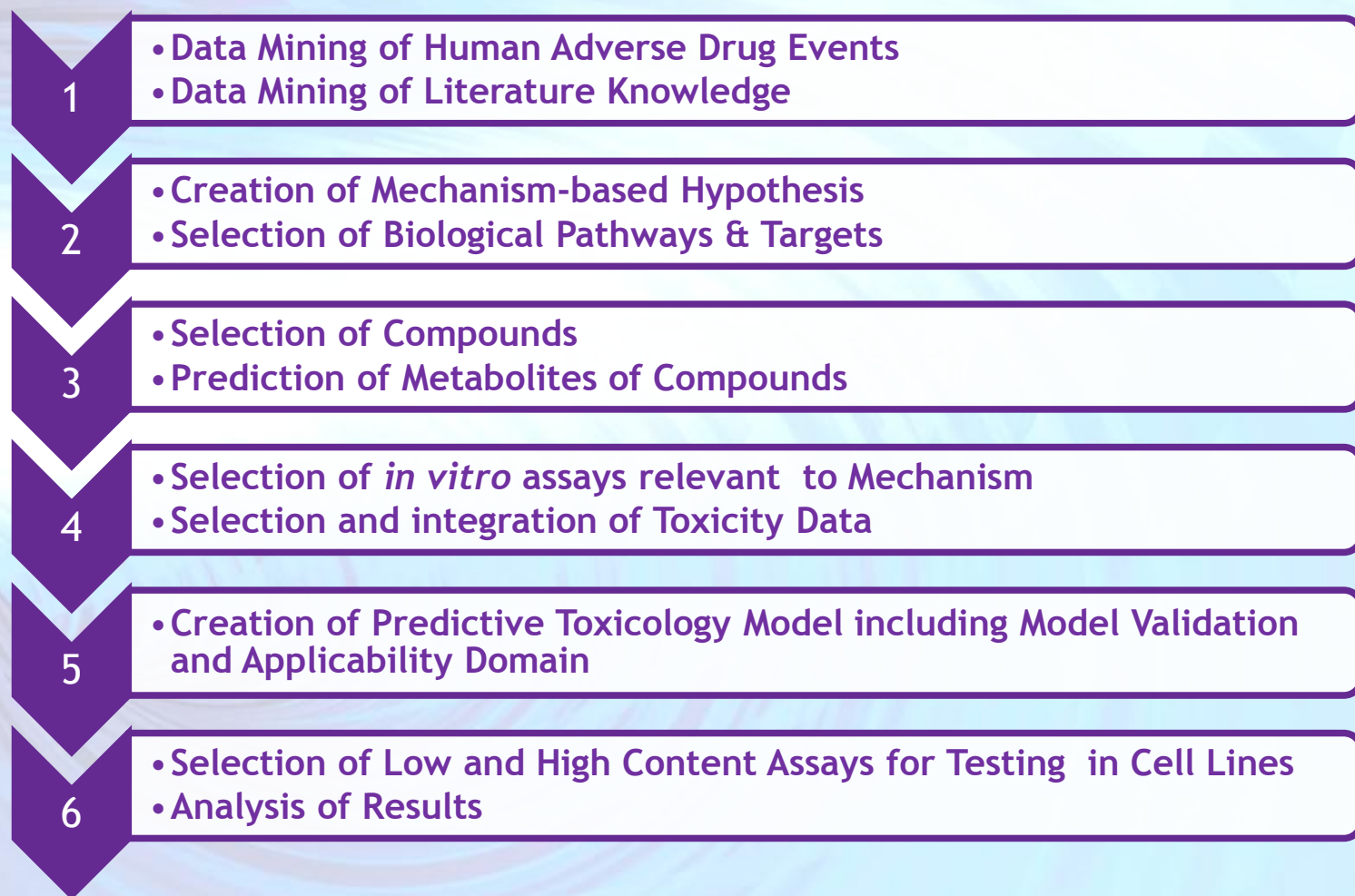
SYNERGY website:
www.synergy-ist.eu/



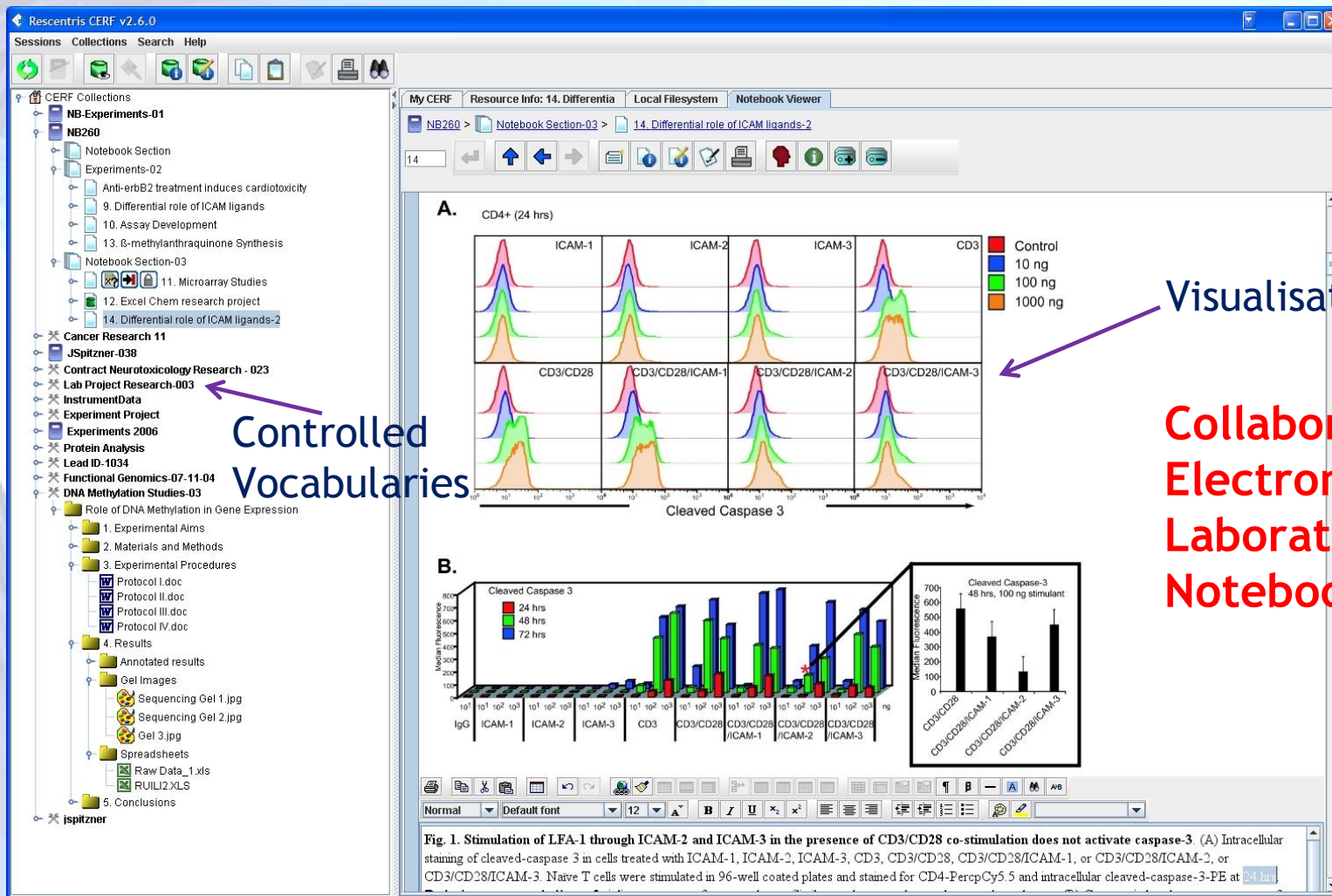
Virtual Organisation Pilots



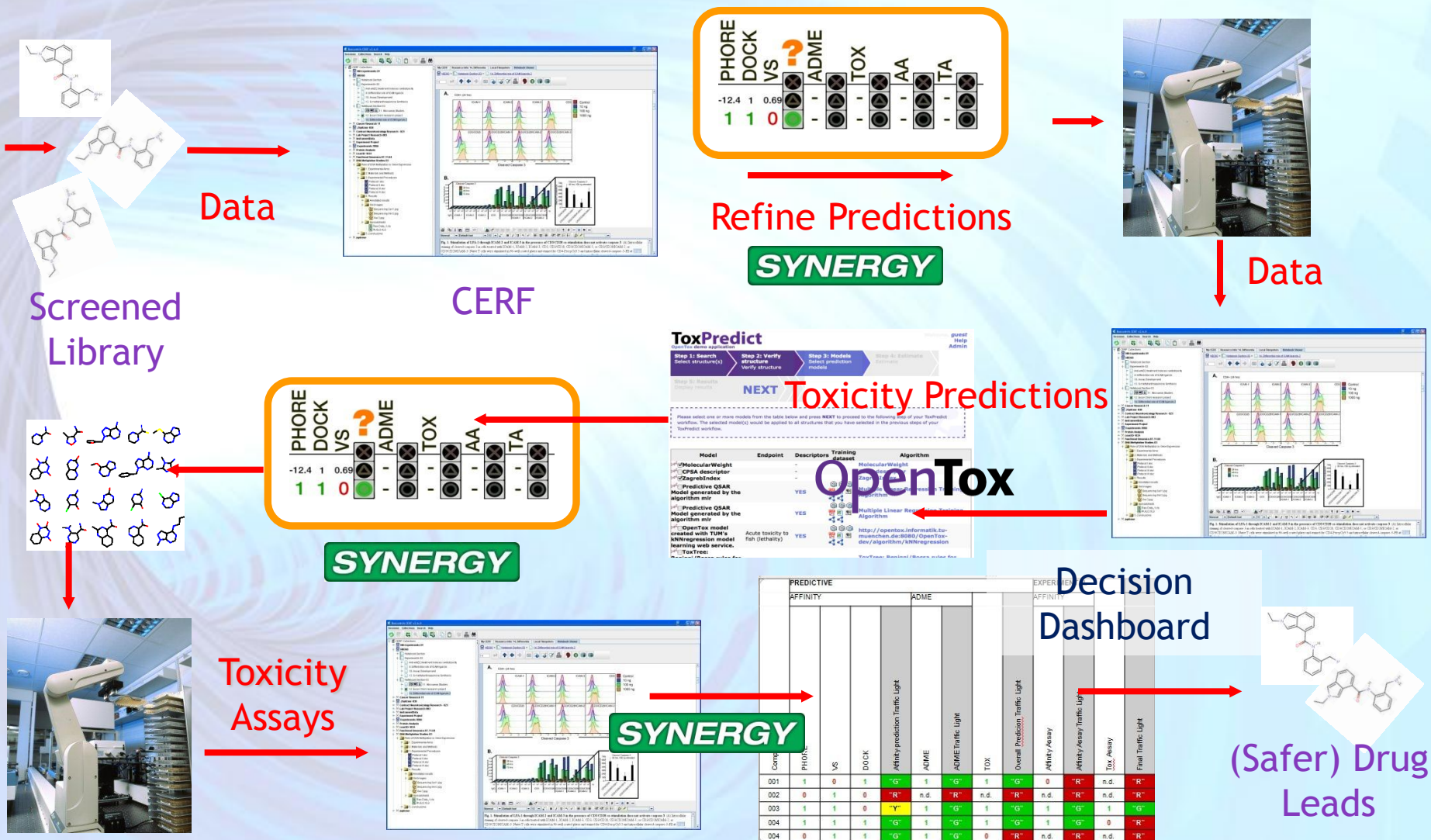
OpenTox - Synergy Predictive Toxicology VO Pilot Strategy Development & Case Study



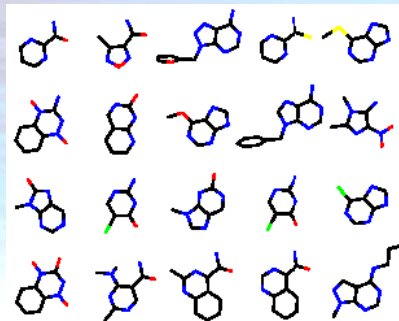
Recording of Collaborative R&D



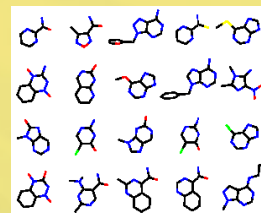
Synergy Collaboration Pilots



1. A library of compounds is entered to the ELN



ELN

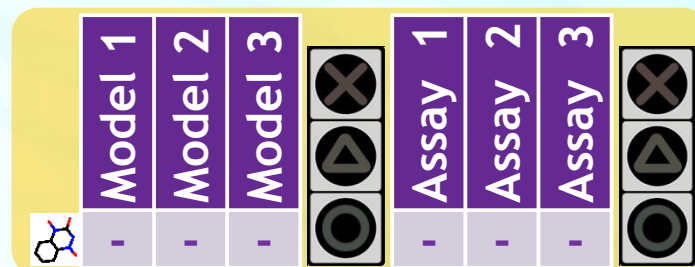


Synergy

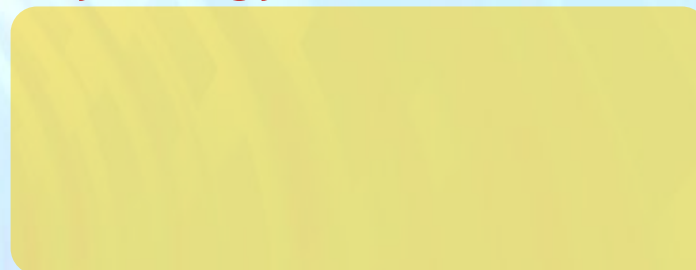
OpenTox

2. Each compound is assigned a data structure in ELN

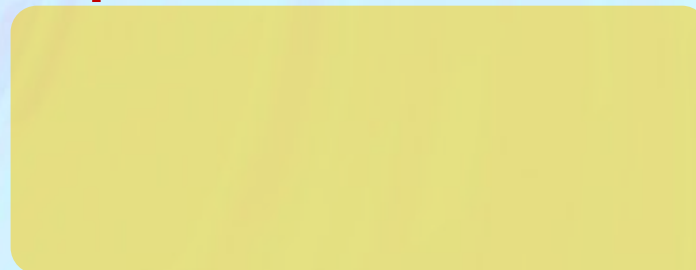
ELN



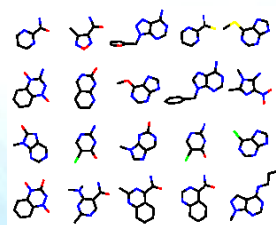
Synergy



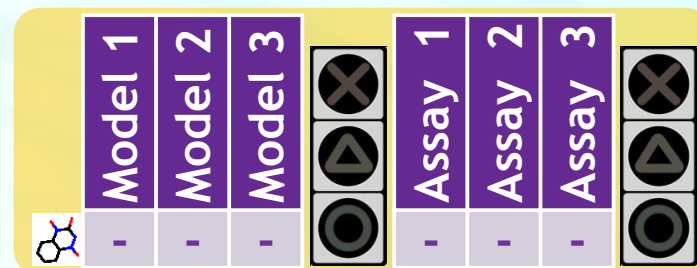
OpenTox



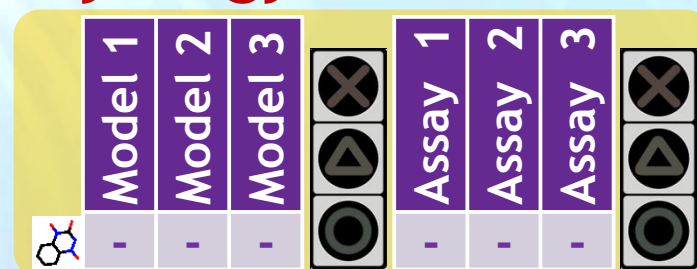
3. ELN passes compounds to OpenTox and SYNERGY



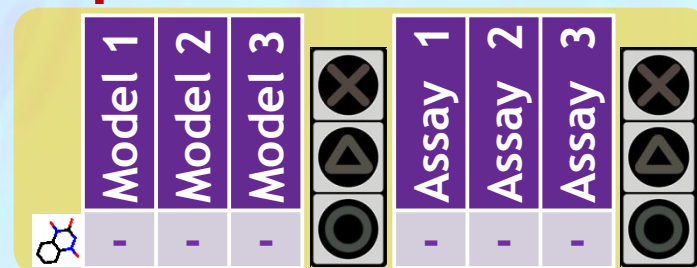
ELN



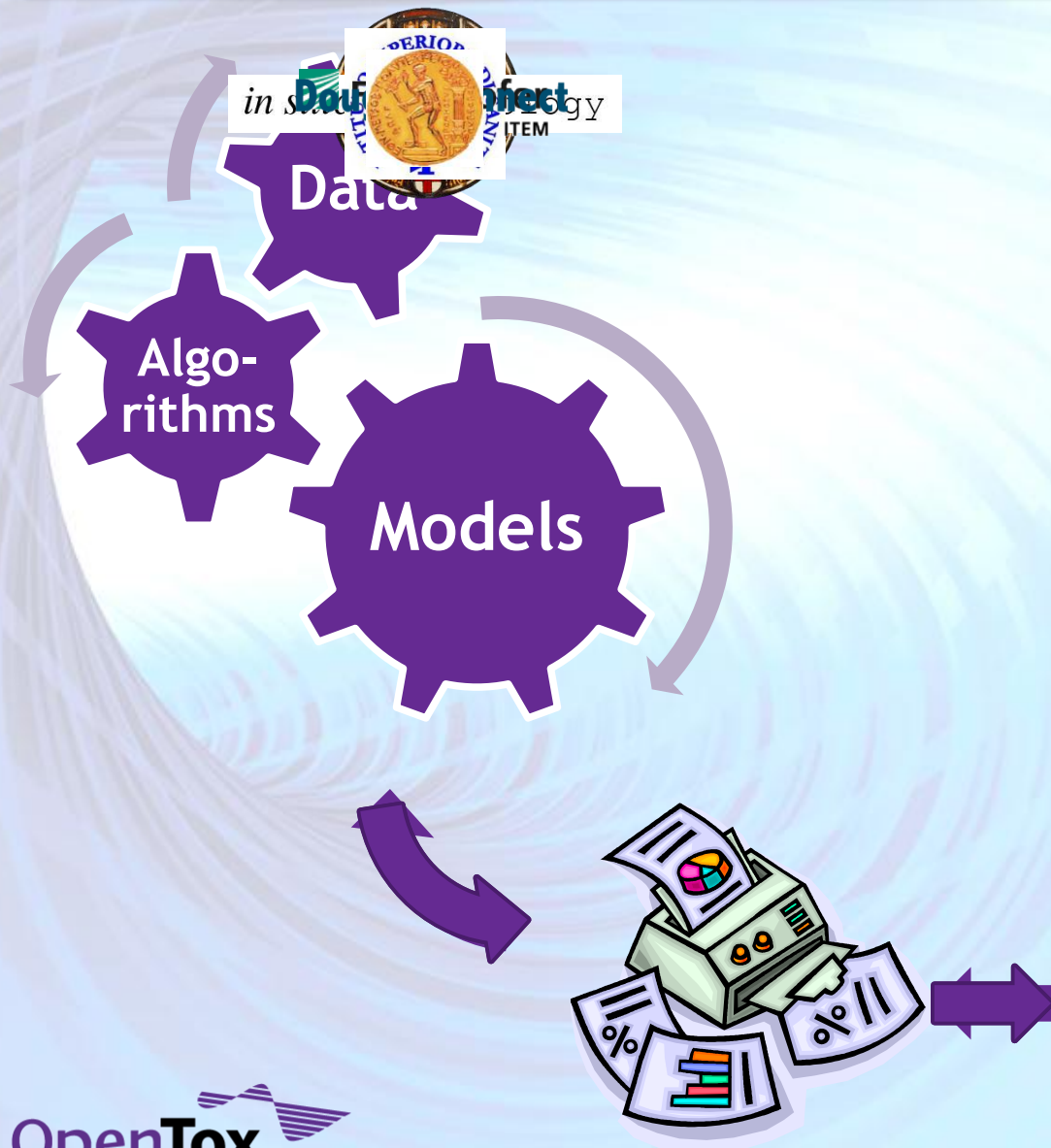
Synergy










OpenTox










4. OpenTox computes toxicity predictions










ELN

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	-	-	-		-	-	-	
	-	-	-		-	-	-	
	-	-	-		-	-	-	

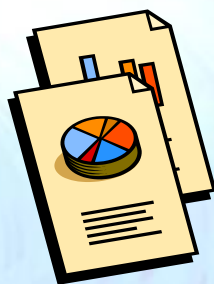
Synergy

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	-	-	-		-	-	-	
	-	-	-		-	-	-	
	-	-	-		-	-	-	

OpenTox

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	1	0	1		-	-	-	
	-	-	-		-	-	-	
	-	-	-		-	-	-	

5. OpenTox sends back a report to ELN



ELN

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	1	0	1		-	-	-	

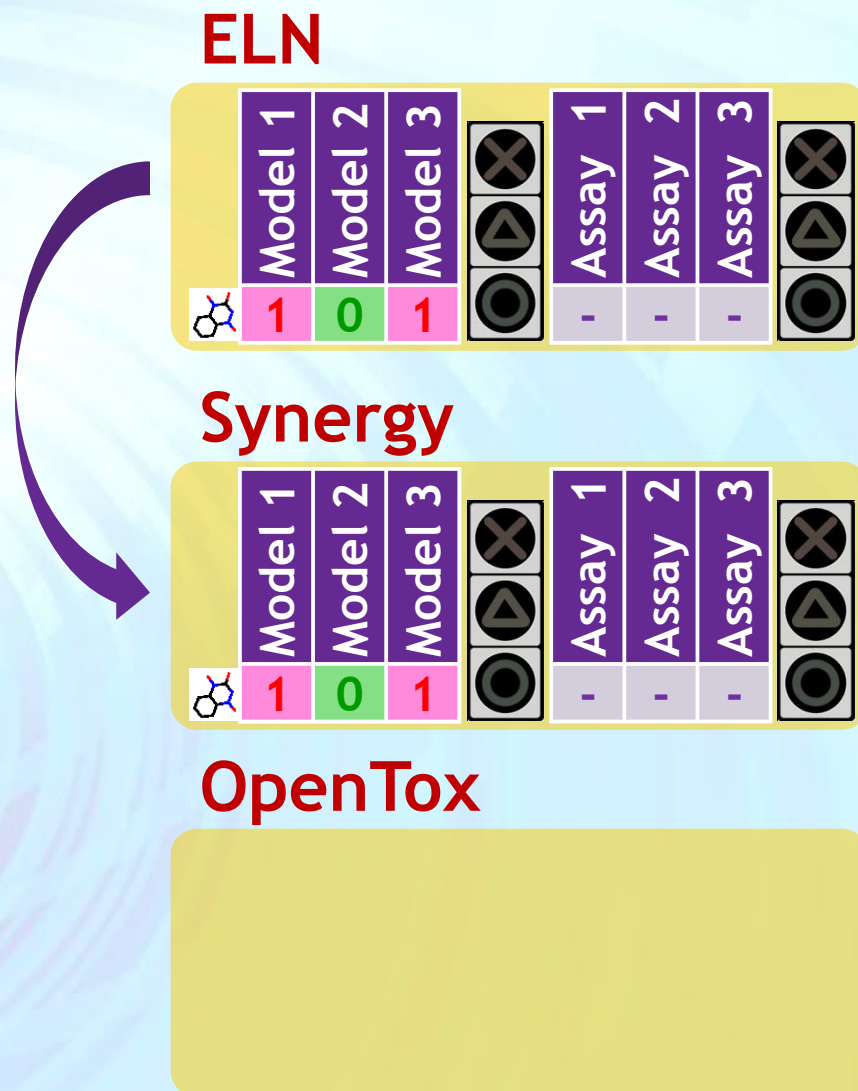
Synergy

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	-	-	-		-	-	-	

OpenTox

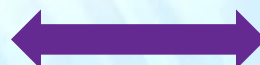
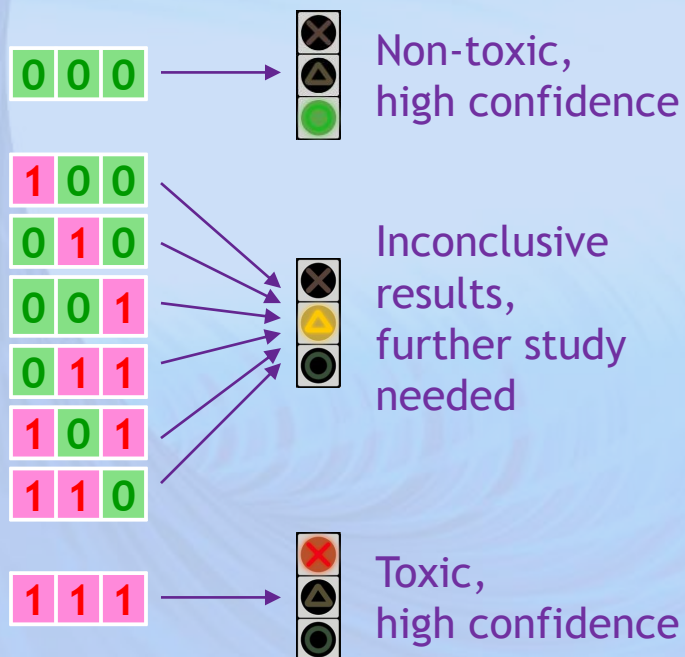
	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	1	0	1		-	-	-	

6. ELN sends the results to SYNERGY

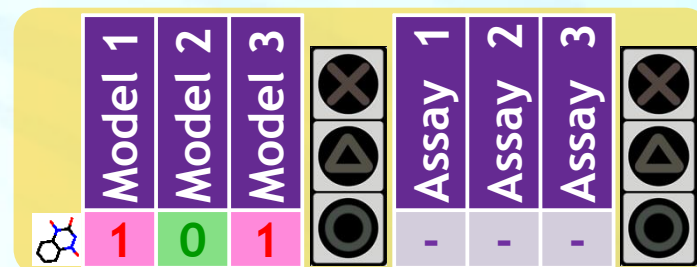


7. SYNERGY applies the Recommendation Rules

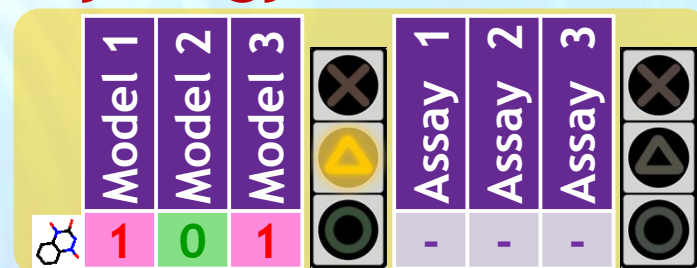
Recommendation Rules:



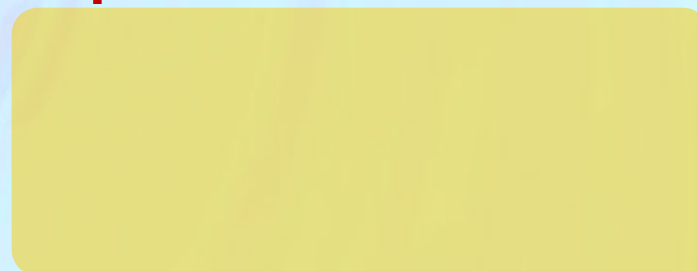
ELN



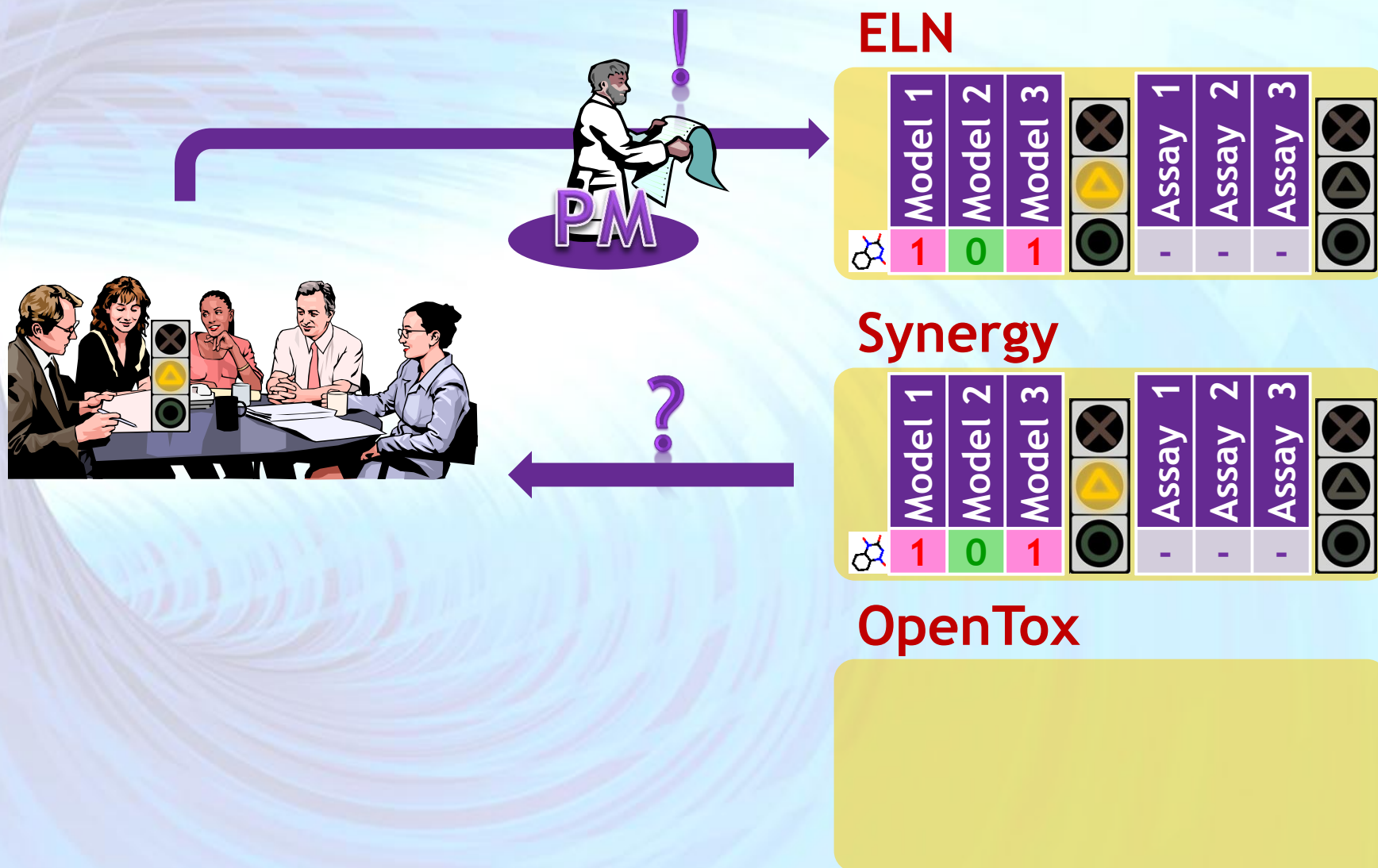
Synergy



OpenTox












8. Inconclusive data → SYNERGY calls a meeting












9. Experimental assays confirm toxicity



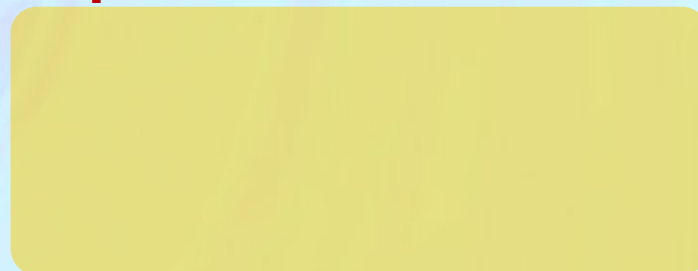
ELN

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	1	0	1		-	1	1	
								

Synergy

	Model 1	Model 2	Model 3		Assay 1	Assay 2	Assay 3	
	1	0	1		-	-	-	
								

OpenTox



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Surajit Ray
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Final words...

For more information, visit

www.opentox.org

Contact Project Coordinator:

barry.hardy@douglasconnect.com

+41 61 851 0170

**Many thanks for your
attention!**



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