

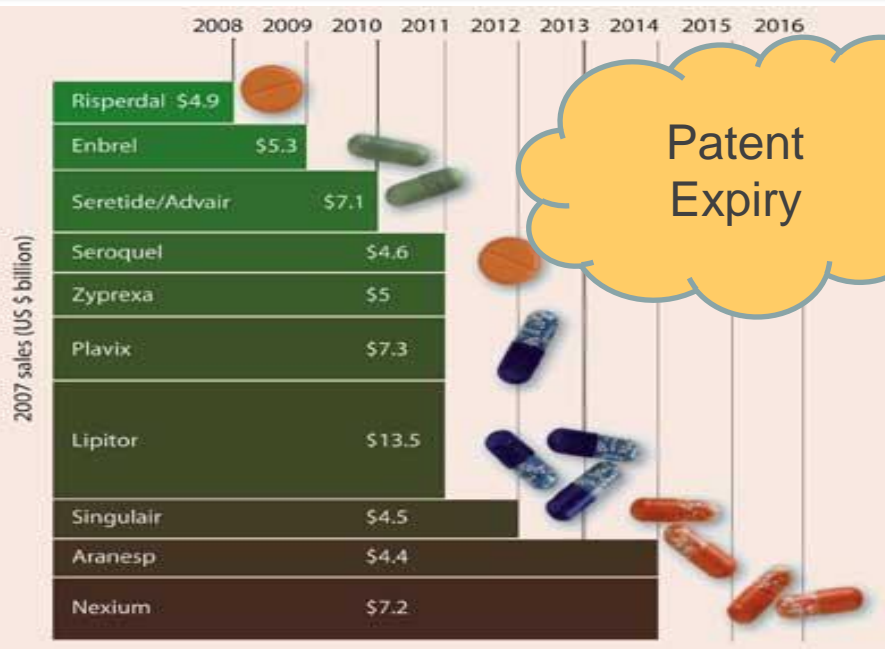
Open PHACTS

Linked Open Data for Drug Discovery

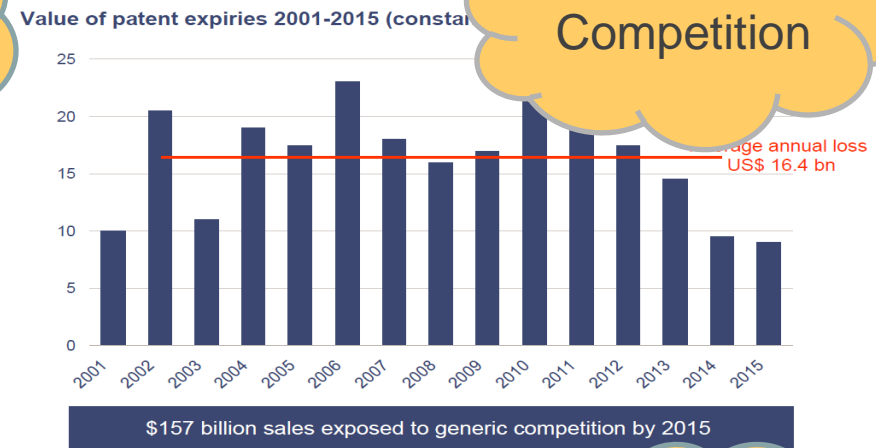
Herman van Vlijmen – Janssen Pharmaceutica
Orri Erling – OpenLink Software

Linked Open Data congress, Hilversum, 25 June 2014

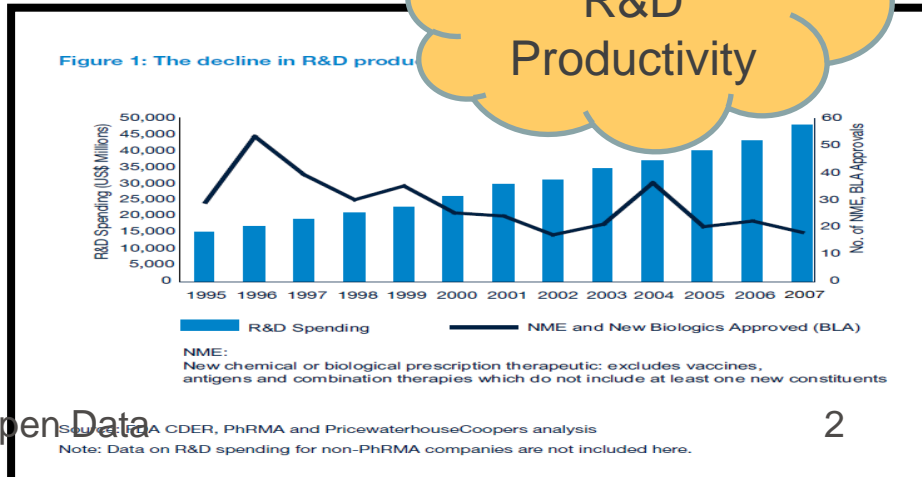
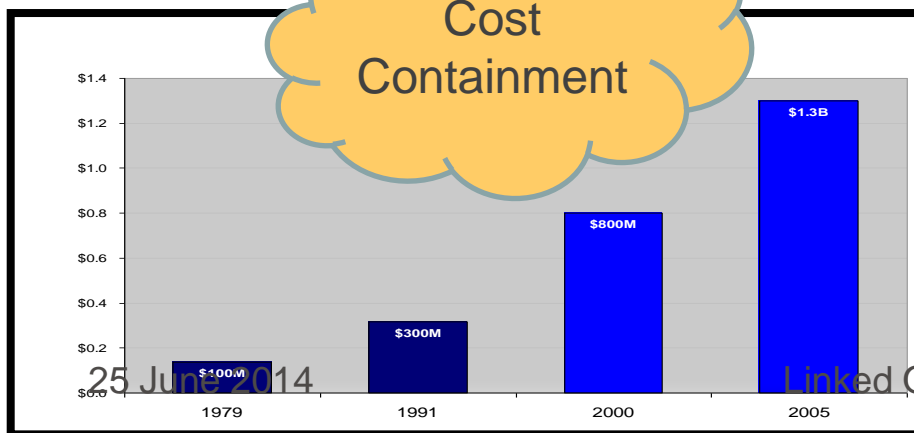
The Pharma Industry Challenges in a Changing Landscape



Resulting in a sales revenue loss of US\$ 16.4 bn



<http://www.rsc.org/chemistryworld/le...>
[Cliff.asp](http://www.Cliff.asp) [OnThePatent](http://www.OnThePatent)



PricewaterhouseCoopers LLP

Source: IMS Health

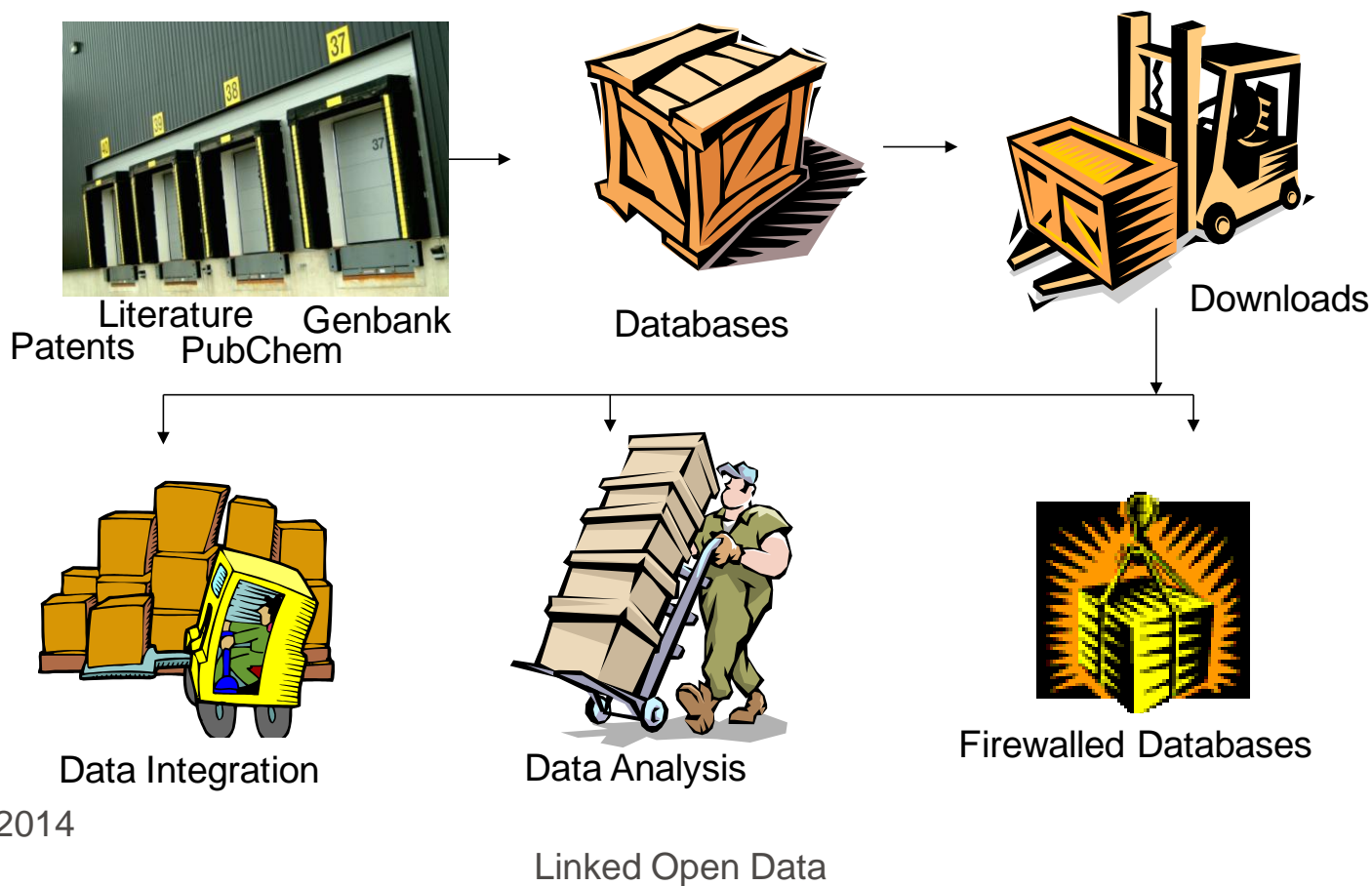
PwC - Pharma 202

25 June 2014

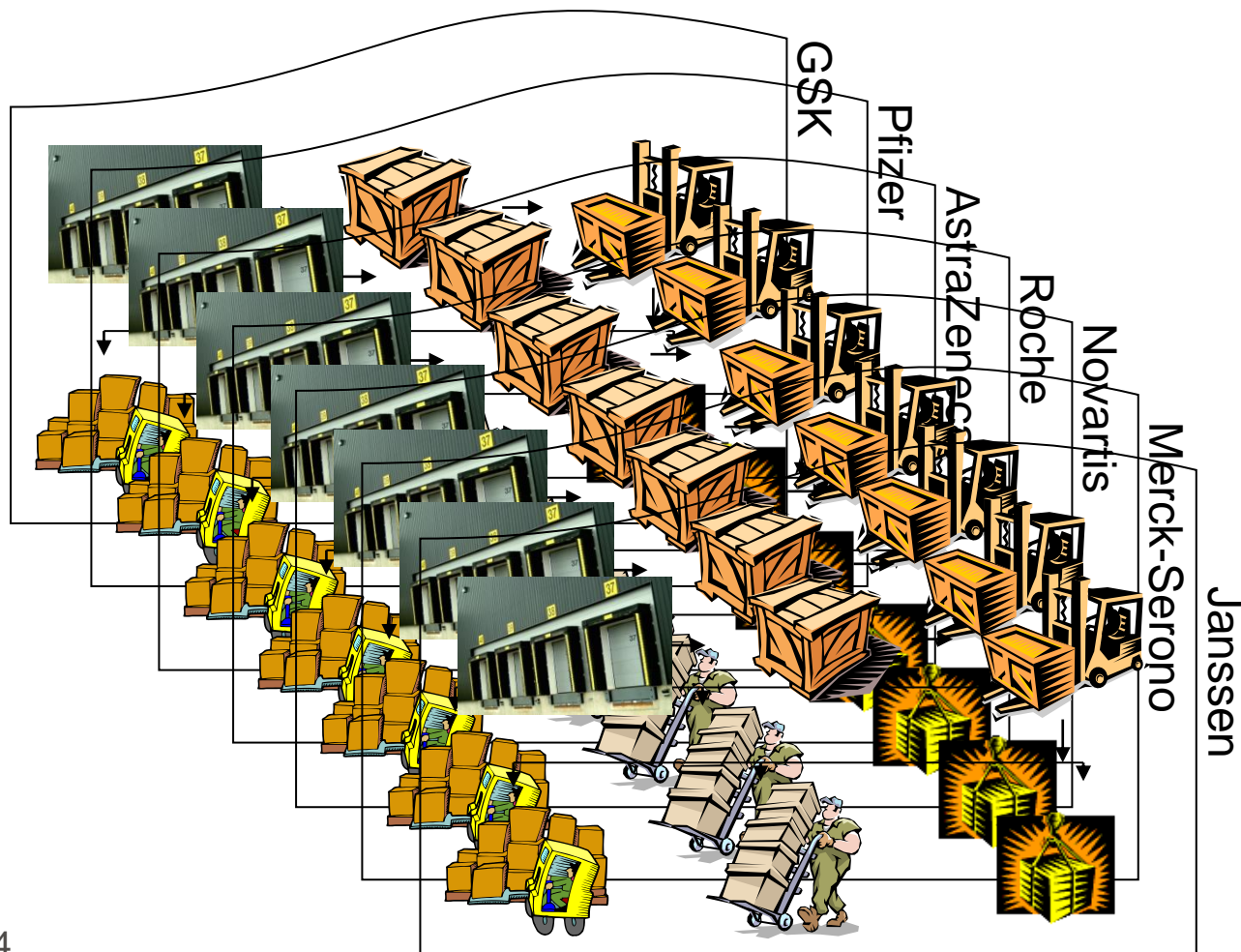
Linked Open Data

Public Domain Drug Discovery Data:

Pharma are accessing, processing, storing & re-processing



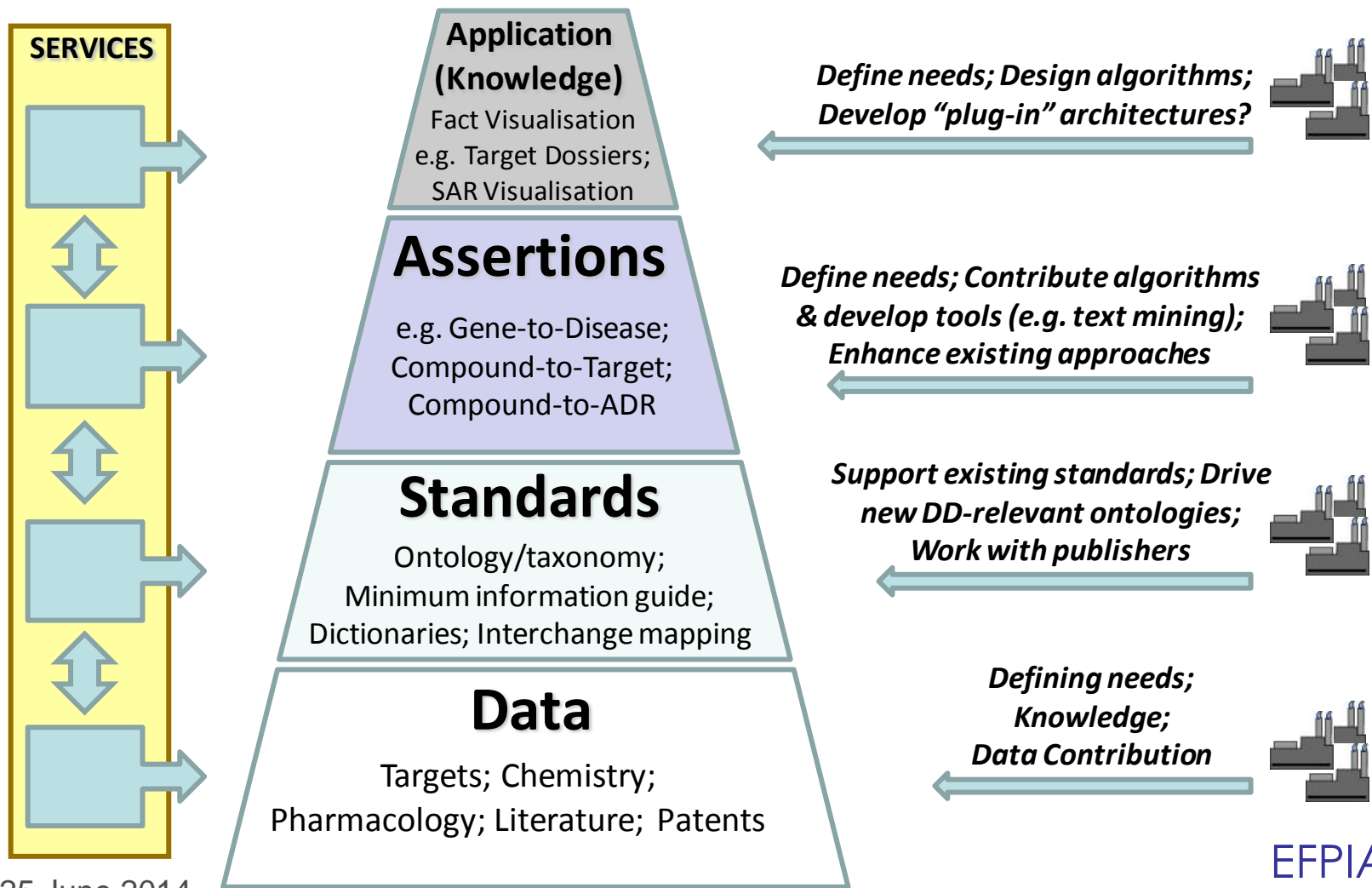
We are all doing this many times.....



25 June 2014

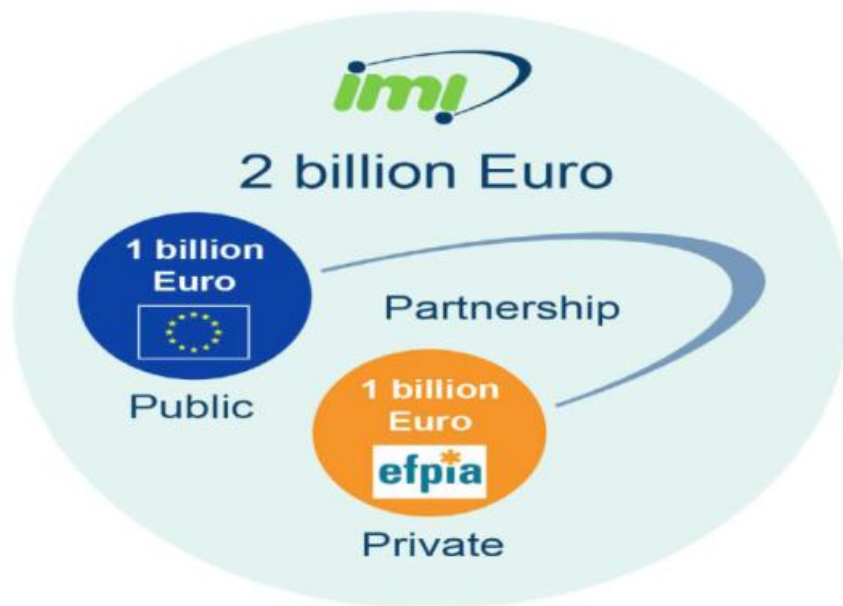
Linked Open Data

- ❖ Create a *semantic integration hub* (“*Open Pharmacological Space*”)
- ❖ Delivering services to support on-going drug discovery programs in pharma and public domain
- ❖ *Not just another project*; Leading academics in semantics, pharmacology and informatics, driven by solid industry business requirements
- ❖ 16 academic partners, 9 pharmaceutical companies, 4 biotechs
- ❖ Work split into clusters:
 - ❖ Technical Build: Create the technology
 - ❖ Scientific Drive: Develop use cases and exemplar applications
 - ❖ Community & Sustainability: Engage community and build the future



25 June 2014

IMI: The Innovative Medicines Initiative



- ❖ Biggest public-private partnership in area of medicine
- ❖ Collaboration between European Commission and European Federation of Pharmaceutical Industries and Associations (EFPIA)
- ❖ Promotion of medical innovation in Europe
- ❖ Tackle key bottlenecks
- ❖ Recognises “in kind” contributions
- ❖ Focus on key problems
 - Efficacy, Safety, Education & Training, **Knowledge Management**

Project Partners

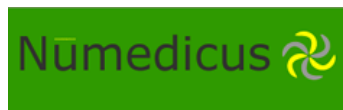
Universität Wien
Technical University of Denmark
University of Hamburg, Center for
Bioinformatics
BioSolveIT GmbH
Consorti Mar Parc de Salut de Barcelona
Leiden University Medical Centre
Royal Society of Chemistry
Vrije Universiteit Amsterdam
Spanish National Cancer Research
Centre

University of Manchester
Maastricht University
Aqnowledge
University of Santiago de Compostela
Rheinische Friedrich-Wilhelms-
Universität Bonn
Netherlands Bioinformatics Centre
Swiss Institute of Bioinformatics
ConnectedDiscovery
EMBL-European Bioinformatics Institute
OpenLink Software
Open PHACTS Foundation

Pfizer
Novartis
Merck Serono
H. Lundbeck A/S
Eli Lilly
Janssen
AstraZeneca
GlaxoSmithKline
Esteve



Associate Partners



THOMSON REUTERS

25 June 2014

Linked Open Data

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A use-case driven approach, focussed on delivery for the real world

- ❖ Main architecture, technical implementation and primary capabilities driven by a set of **prioritised research questions**
- ❖ Based on the main research questions define **prioritised data sources**
- ❖ Develop **three Exemplars** to demonstrate the capabilities of the Open PHACTS System and to define interfaces and input/output standards

What do we need?

"All oxidoreductase inhibitors active <100nM in both human and mouse"



"Compounds that agonize targets in pathway X assayed in functional assays with a potency <1 mM"



"Find me compounds that inhibit targets in NFkB pathway assayed in only functional assays with a potency <1 μM"



ChEMBL

DrugBank

Gene
Ontology

Wikipathways

GeneGo

ChEBI

Uniprot

UMLS

GVKBio

ConceptWiki

ChemSpider

TrialTrove

TR Integrity

The Open PHACTS infrastructure can support many different domains & questions

TABLE 1

The top 20 research questions

Question number	Question
Cluster I	
Q1	Give me all oxidoreductase inhibitors active <100 nM in human and mouse
Q2	Given compound X, what is its predicted secondary pharmacology? What are the on- and off-target safety concerns for a compound? What is the evidence and how reliable is that evidence (journal impact factor, KOL) for findings associated with a compound?
Q3	Given a target, find me all actives against that target. Find/predict polypharmacology of actives. Determine ADMET profile of actives
Q4	For a given interaction profile – give me similar compounds
Q5	The current Factor Xa lead series is characterized by substructure X. Retrieve all bioactivity data in serine protease assays for molecules that contain substructure X
Q6	A project is considering protein kinase C alpha (PRKCA) as a target. What are all the compounds known to modulate the target directly? What are the compounds that could modulate the target directly? I.e. return all compounds active in assays where the resolution is at least at the level of the target family (i.e. PKC) from structured assay databases and the literature
Q7	Give me all active compounds on a given target with the relevant assay data
Q8	Identify all known protein–protein interaction inhibitors
Q9	For a given compound, give me the interaction profile with targets
Q10	For a given compound, summarize all 'similar compounds' and their activities
Q11	Retrieve all experimental and clinical data for a given list of compounds defined by their chemical structure (with options to match stereochemistry or not)
Cluster II	
Q12	For my given compound, which targets have been patented in the context of Alzheimer's disease?
Q13	Which ligands have been described for a particular target associated with transthyretin-related amyloidosis, what is their affinity for that target and how far are they advanced into preclinical/clinical phases, with links to publications/patents describing these interactions?
Q14	Target druggability: compounds directed against target X have been tested in which indications? Which new targets have appeared recently in the patent literature for a disease? Has the target been screened against in AZ before? What information on <i>in vitro</i> or <i>in vivo</i> screens has already been performed on a compound?
Q15	Which chemical series have been shown to be active against target X? Which new targets have been associated with disease Y? Which companies are working on target X or disease Y?
Q16	Which compounds are known to be activators of targets that relate to Parkinson's disease or Alzheimer's disease
Q17	For my specific target, which active compounds have been reported in the literature? What is also known about upstream and downstream targets?
Q18	Compounds that agonize targets in pathway X assayed in only functional assays with a potency <1 μM
Q19	Give me the compound(s) that hit most specifically the multiple targets in a given pathway (disease)
Q20	For a given disease/indication, give me all targets in the pathway and all active compounds hitting them

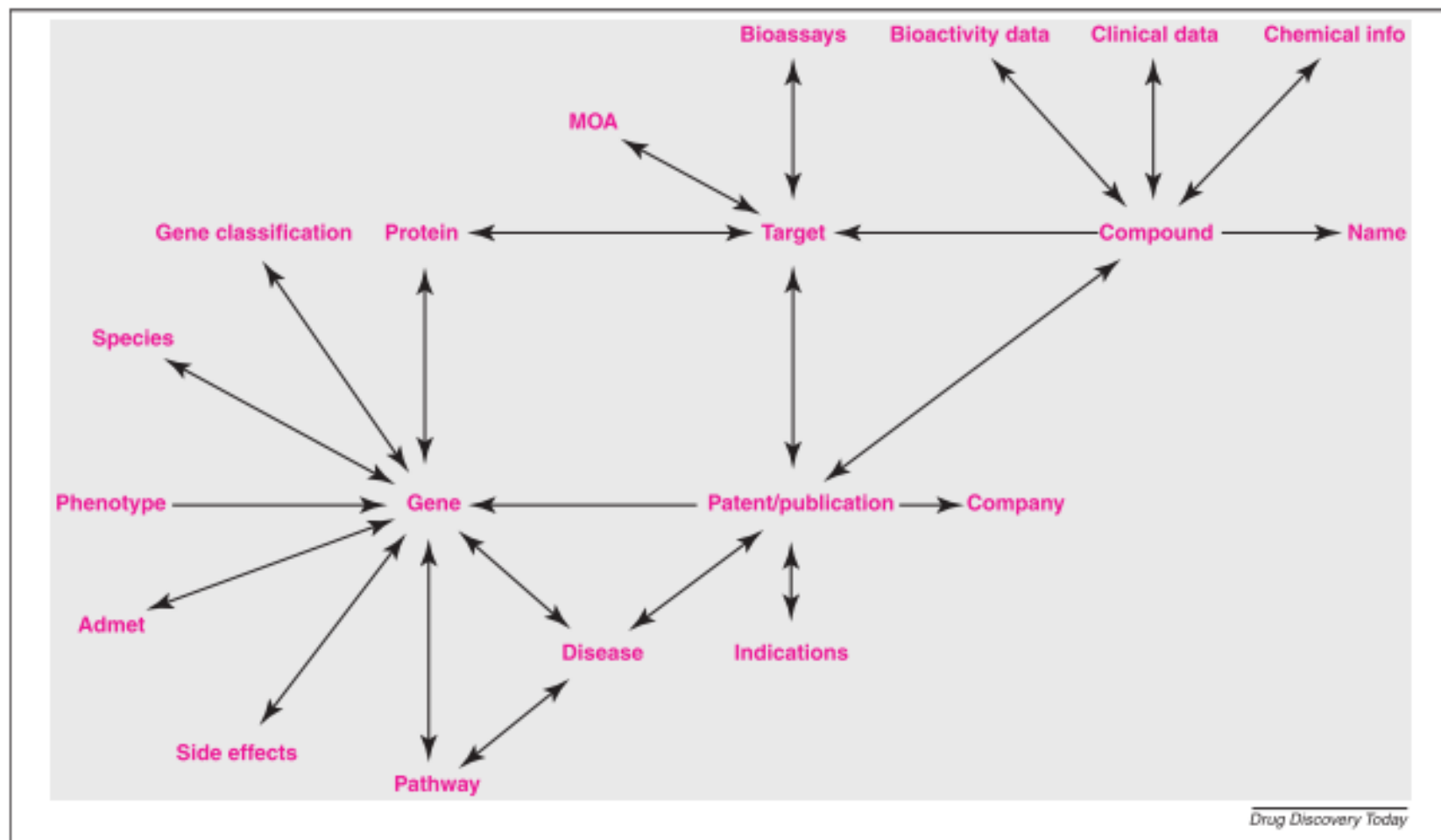
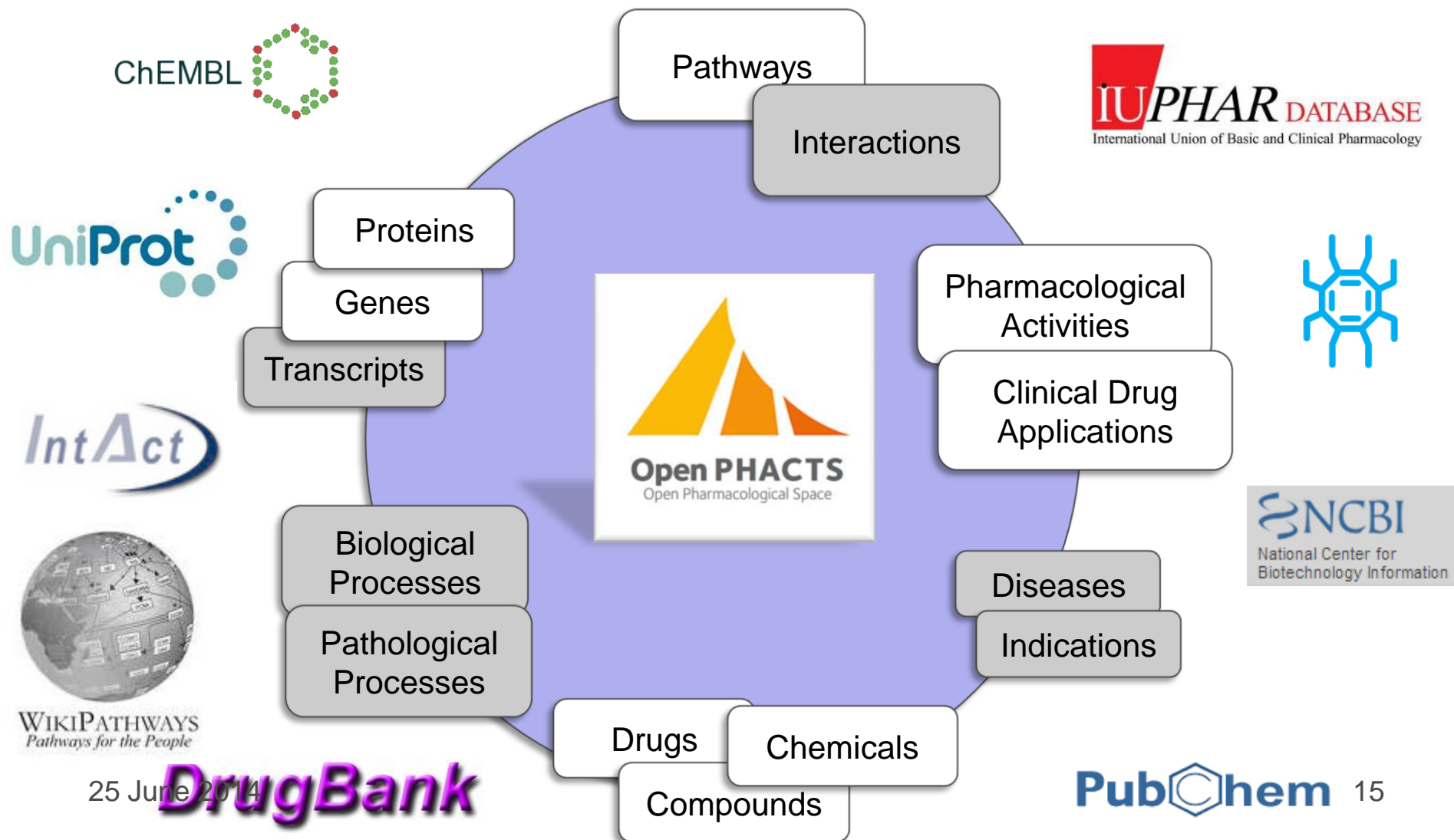


FIGURE 2

Network of data associations needed to answer the top-ranked scientific competency questions. The network reflects a cartoon that summarizes the data associations that are needed to target the top 20 research questions.

Public Data Sources



Oct. 2012

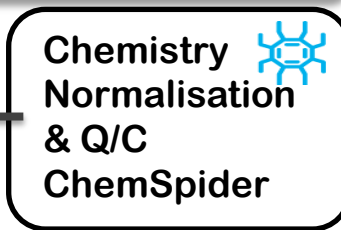
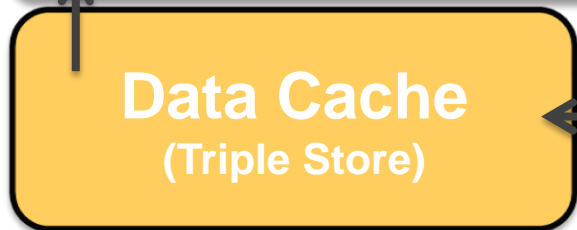
Open PHACTS Explorer

1st Gen Apps

Partner Apps

Ext JS

App Framework



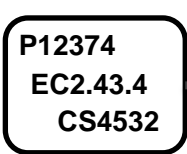
Domain Specific Services



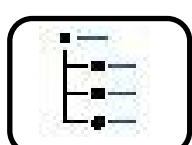
Identity Resolution Service (ConceptWiki)



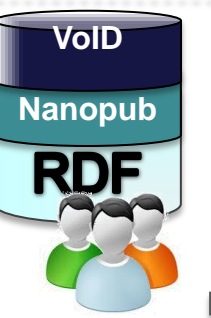
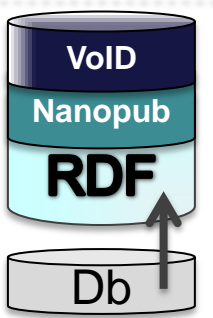
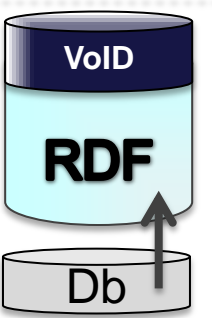
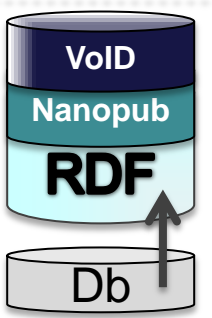
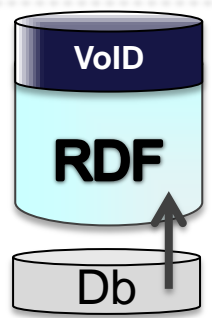
Identifier Management Service (BridgeDb+)



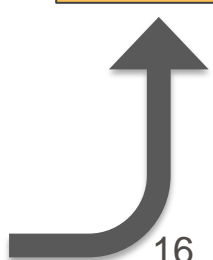
Core Platform



Public Ontologies



User Annotations



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25 June 2014

Public Content

Commercial

Statistics of Datasets Loaded into Open PHACTS Version 1.3

Source	Version	Supplier	Downloaded	Initial Records	Triples	Properties
ChEMBL	ChEMBL 16 RDF	EBI	25 June 2013	1,247,403 (~1,236,686 compounds, 9844 targets, 6243 target components, 873 protein classes)	304,420,681	77
DrugBank	Aug 2008	Bio2Rdf (www4.wiwiss.fu-berlin.de)	08 Aug 2012	19,628 (~14,000 drugs, 5000 targets)	517,584	74
SwissProt, UniParc, UniRef	2013_06	SIB	2013_06		533,394,147	82
ENZYME	2013_07	SIB	2013_07	6,187	47,661	2
ChEBI	Release 104	EBI	19 June 2013	40,575	40,575	2
GeneOntology	Jan 21, 2013	GO	21 Jan 2013	38,137	1,265,273	26
GOA	2013	GO	09 Sept 2013	various species	23,489,501	15
WikiPathways	v0.1_20130710	Maastricht	10 July 2013	946	1,449,981	34
ChemSpider		Open PHACTS Chemistry Registry (OCSR)	Nov 11, 2013		tbc	
ConceptWiki	version 1.3	NBIC	09 Sept 2013	2,828,966	3,739,884	1

Example of vocabulary/ontology challenge

Quantitative Data Challenges

STANDARD_TYPE	UNIT_COUNT
AC50	7
Activity	421
EC50	39
IC50	46
ID50	42
Ki	23
Log IC50	4
Log Ki	7
Potency	11
log IC50	0

IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50
IC50

STANDARD_UNITS	COUNT (*)
nM	829448
ug.mL-1	41000
IC50	38521
ug/ml	2038
ug ml-1	509
mg kg-1	295
molar ratio	178
ug	117
%	113
uM well-1	52
p.p.m.	51
ppm	36
uM-1	25
nM kg-1	25
milliequivalent	22
kJ m-2	20

>5000 types

~ 100 units

Implemented using the Quantities, Dimension, Units, Types
Ontology (<http://www.qudt.org/>)

Nanopublications – Capturing scientific information in the Triple Store



[nature.com](#) ▶ [journal home](#) ▶ [archive](#) ▶ [issue](#) ▶ [commentary](#) ▶ [full text](#)

NATURE GENETICS | COMMENTARY

The value of data

Barend Mons, Herman van Haagen, Christine Chichester, Peter-Bram 't Hoen, Johan T den Dunnen, Gertjan van Ommen, Erik van Mulligen, Bharat Singh, Rob Hooft, Marco Roos, Joel Hammond, Bruce Kiesel, Belinda Giardine, Jan Velterop, Paul Groth & Erik Schultes

[Affiliations](#) | [Contributions](#) | [Corresponding author](#)

Nature Genetics 43, 281–283 (2011) | doi:10.1038/ng0411-281
Published online 29 March 2011

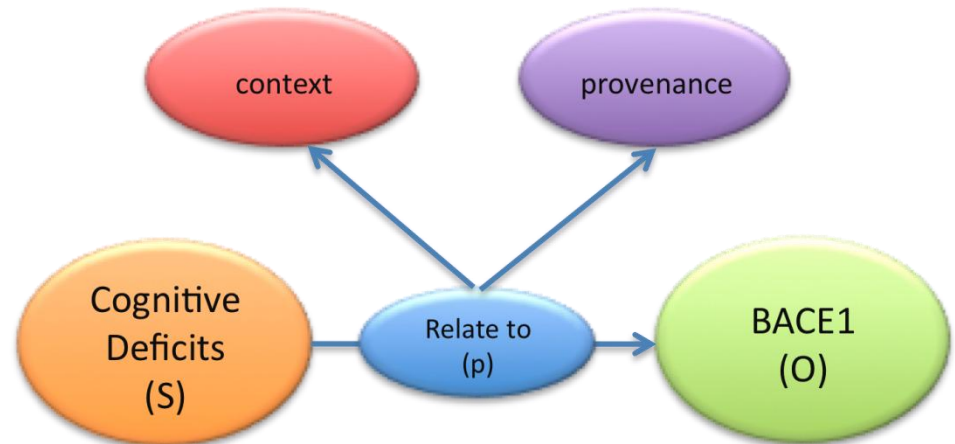
Nano-Publication in the e-science era

Barend Mons^{1,2,3} and Jan Velterop^{1,2},

¹Concept Web Alliance, ²Netherlands BioInformatics Centre, ³Leiden University Medical Center.

barend.mons@nbic.nl, velterop@conceptweballiance.org

25 June 2014



The Anatomy of a Nano-publication

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9 Benfleet Close
Cobham, Surrey, KT11 2NR
United Kingdom
jan.velterop@nbic.nl

ABSTRACT

Linked Open Data

Newer standards like RDFa also facilitate this and integrate with



ChemSpider
Search and share chemistry

CN1CCN(C1)C(=O)Nc2ccc(NC3=CC=CC=C3)cc2

ChEMBL

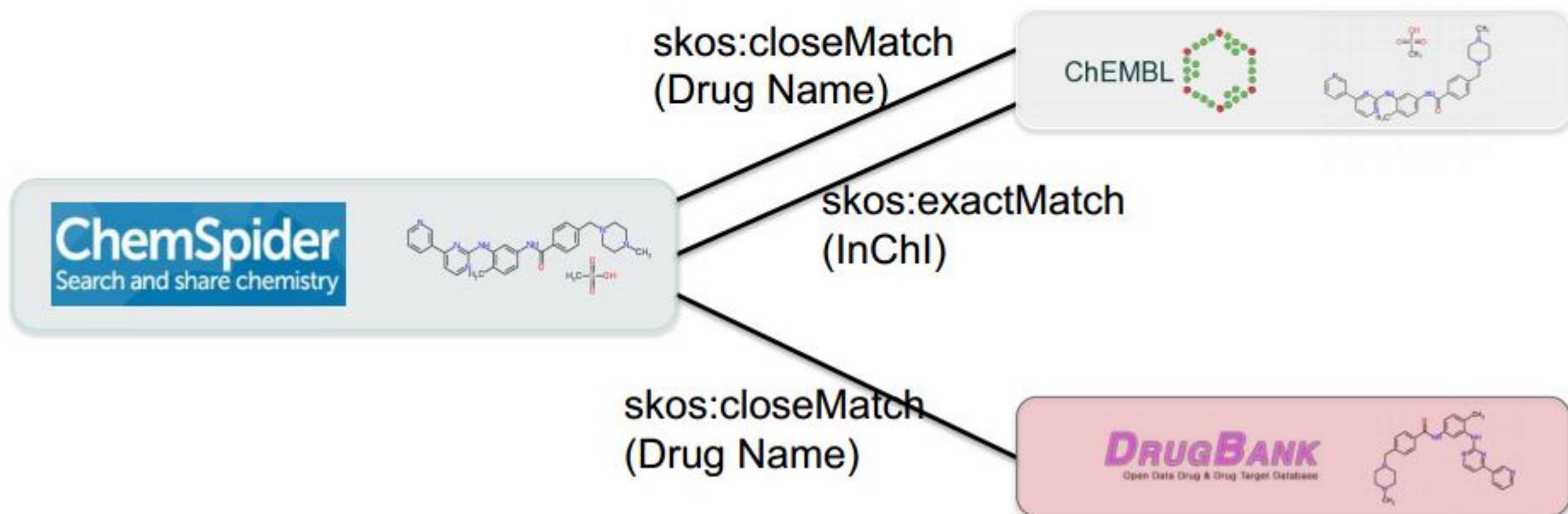
CN1CCN(C1)C(=O)Nc2ccc(NC3=CC=CC=C3)cc2

skos:exactMatch
(InChI)



DRUGBANK
Open Data Drug & Drug Target Database

CN1CCN(C1)C(=O)Nc2ccc(NC3=CC=CC=C3)cc2



Example applications



Browse and search the data within the Open PHACTS Discovery Platform.

✦ Developed by the University of Manchester and University of Vienna



Visualise the chemical and biological space of a molecule group in a chemically-aware manner.

✦ Developed by the University of Hamburg and BioSolveIT GmbH



Navigate pharmacological space in a flexible and interactive way.

✦ Developed by the Consorci Mar Parc de Salut de Barcelona (PSMAR)



Connects the latest news and events in Pharma and Biotech directly to pharmacology data within the Open PHACTS platform.

✦ Developed by SciBite Limited



Allows the semantic enrichment of scientific articles in PDF format.

✦ Developed by the University of Manchester



Intuitive predicts target pharmacology based on the Similar Ensemble Approach.

✦ Developed by the Technical University of Denmark



Extracts data to build QSAR predictive models with data from the eTOX project.

✦ Developed by PSMAR as part of the eTOX project



A repository of useful Pipeline Pilot components and workflows has been developed.

🏠 Open PHACTS - Pipeline Pilot Community



A KNIME repository of components and workflows has been developed.

🏠 Open PHACTS - KNIME Community



Queries the Open PHACTS API from Microsoft's Excel spreadsheet software.

✦ Developed by the University of Vienna



Identifies significant entities in scientific text, and provides links to Open PHACTS Explorer.

✦ Developed by AQknowledge



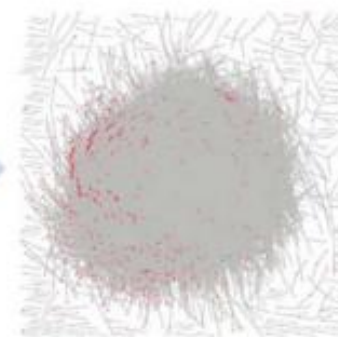
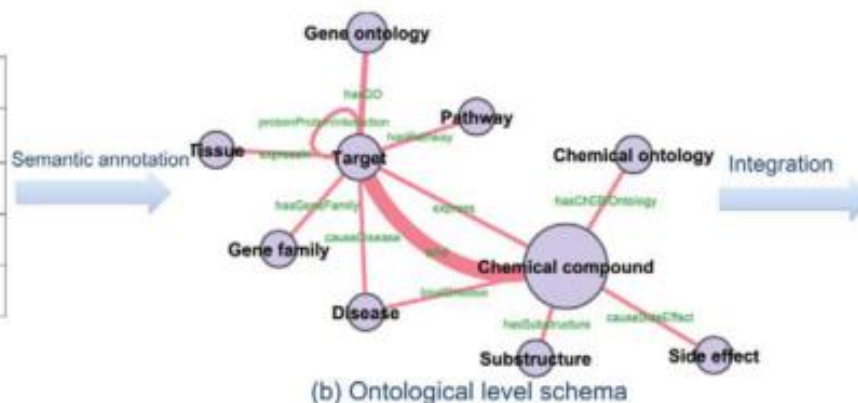
Helium for Excel Community Edition contains three functions that use the Open PHACTS API.

✦ Developed by Ceiba Solutions

More complex use cases: Relating two distant concepts

PubChem	ChEBI	DrugBank
UniProt	UniProtKB-GOA	HGNC
SIDER	OMIM	KEGG
HPRD	ChEMBL	TTD
BindingDB	CTD	PDSP

(a) Raw Data Sets



(c) Semantic Linked Data

1. Edge weight:

$$p(e(i \rightarrow j)) = \frac{1}{\sum_k^{n-1} R_{i,n} == R_{i,j}}$$

2. Path score:

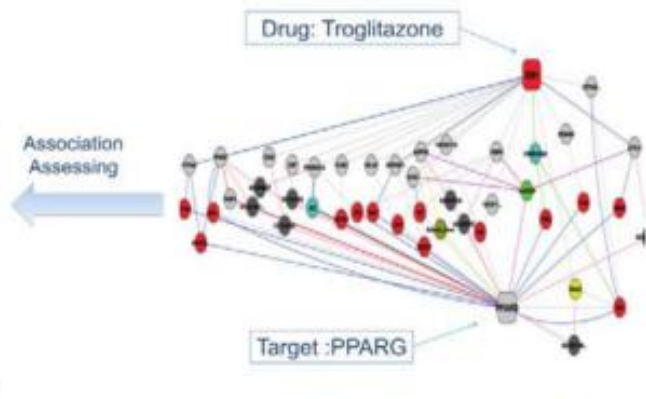
$$p(P_i(t \rightarrow s)) = p(P_i(e_{m \rightarrow m-1}, \dots, e_{3 \rightarrow 2}, e_{2 \rightarrow 1})) = \prod_{i=1}^{m-1} e_{i+1 \rightarrow i}$$

$$\log(p(P_i(t \rightarrow s))) = \sum_{i=1}^{m-1} \log(e_{i+1 \rightarrow i})$$

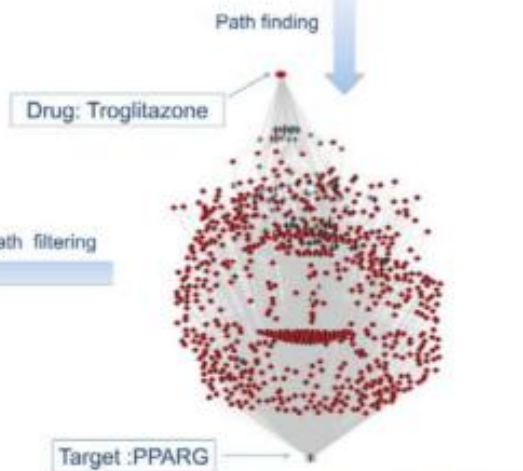
3. Association score

$$\text{raw score}(s, t) = \sum_i^n \frac{\log(p(P_i)) - \theta(\log(P_i))}{\sigma(\log(P_i))}$$

(f) Statistical Models



(e) Significant Paths between Two Nodes



(d) Paths (length <4) between Two Nodes

Figure 1. SLAP pipeline. An ontology is used to annotate public data sets and integrate them into a semantic linked network. Two nodes are linked by one or more number of paths, but only a small number of significant paths are kept for association estimation. The path significance and drug target associations are assessed by statistical models derived from random samples.

doi:10.1371/journal.pcbi.1002574.g001

- ❖ Continue improving the system: features, performance, API calls, etc
- ❖ Expand implementation of data sources based on new set of scientific use cases – Project received 2 years additional funding
- ❖ Development and improvement of new and existing applications that use the Open PHACTS API
- ❖ Set up organizational model to continue maintenance and development after IMI funding

The Open PHACTS consortium

Play!

API: <https://dev.openphacts.org/>

