

ENABLING TAILORED THERAPEUTICS WITH LINKED DATA

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Linking Open Drug Data (LODD) Task Force

<http://esw.w3.org/topic/HCLSIG/LODD>

Outline

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- Linking Open Drug Data Project
 - ▣ Objectives and Status
- Published linked data sources
- Interlinking of the data sources
- Business use cases
- Conclusion and Future Work

Linking Open Drug Data

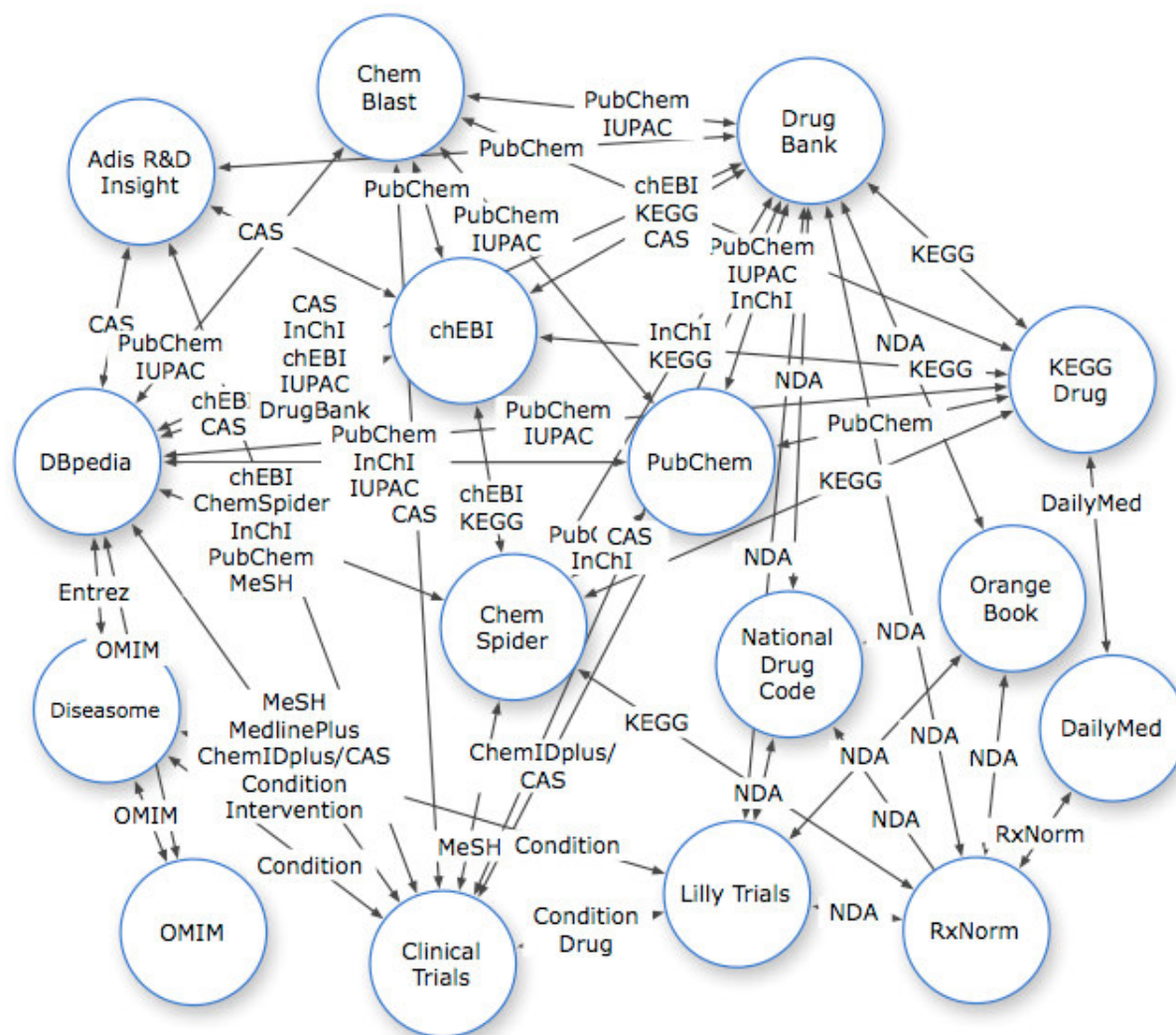
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- An HCLSIG task force
 - ▣ Started October 1st, 2008
- Primary Objectives
 - ▣ Survey publicly available data sets about drugs
 - ▣ Publish and interlink these data sets on the Web
 - ▣ Explore interesting questions that could be answered if the data sets are linked

Survey of Existing Data sets

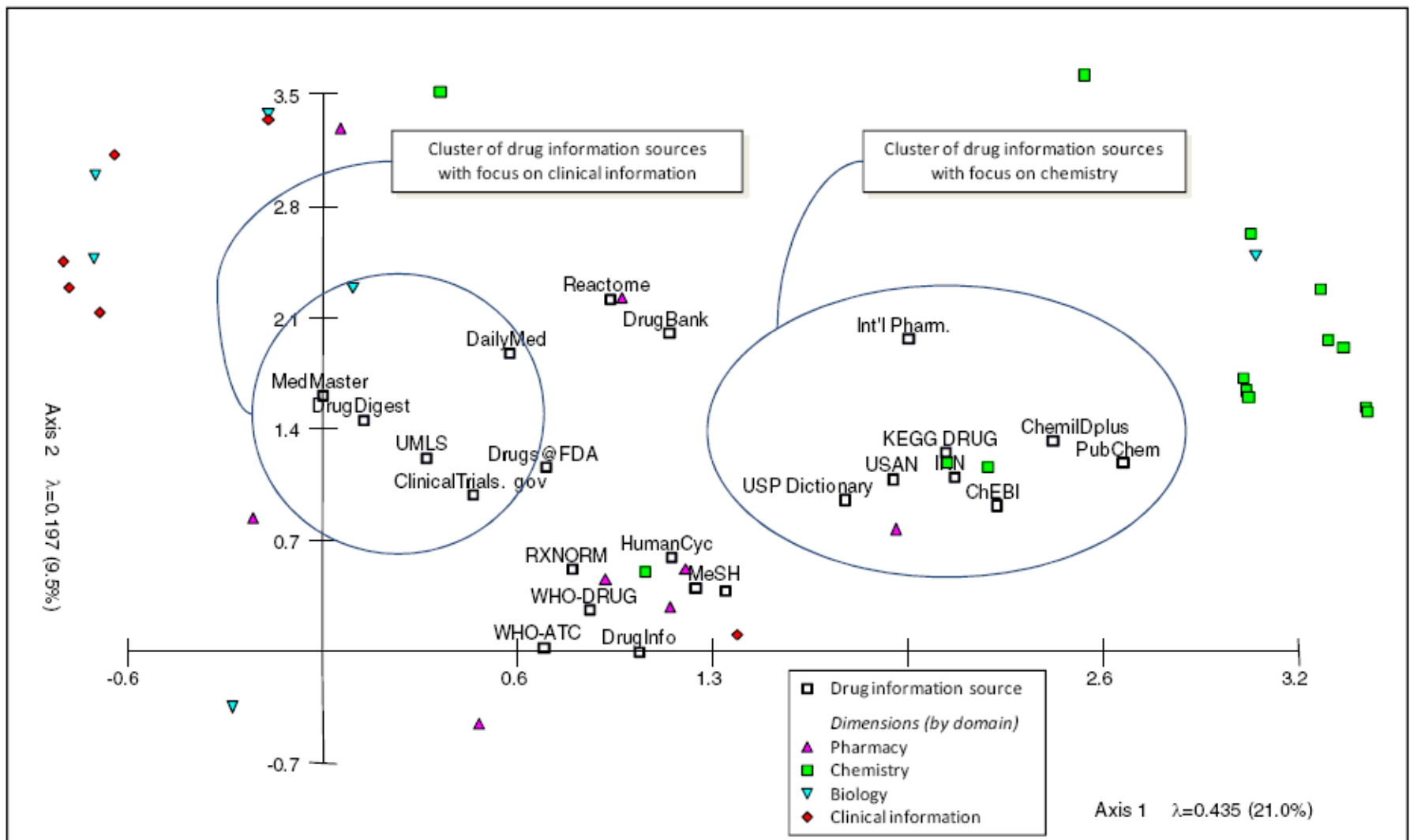
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□ <http://esw.w3.org/topic/HCLSIG/LODD/Data>



Drug Data Sources

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- Source: Mark Sharp, et al. (AMIA 2008)
A Framework for Characterizing Drug Information Sources

Extending LOD cloud

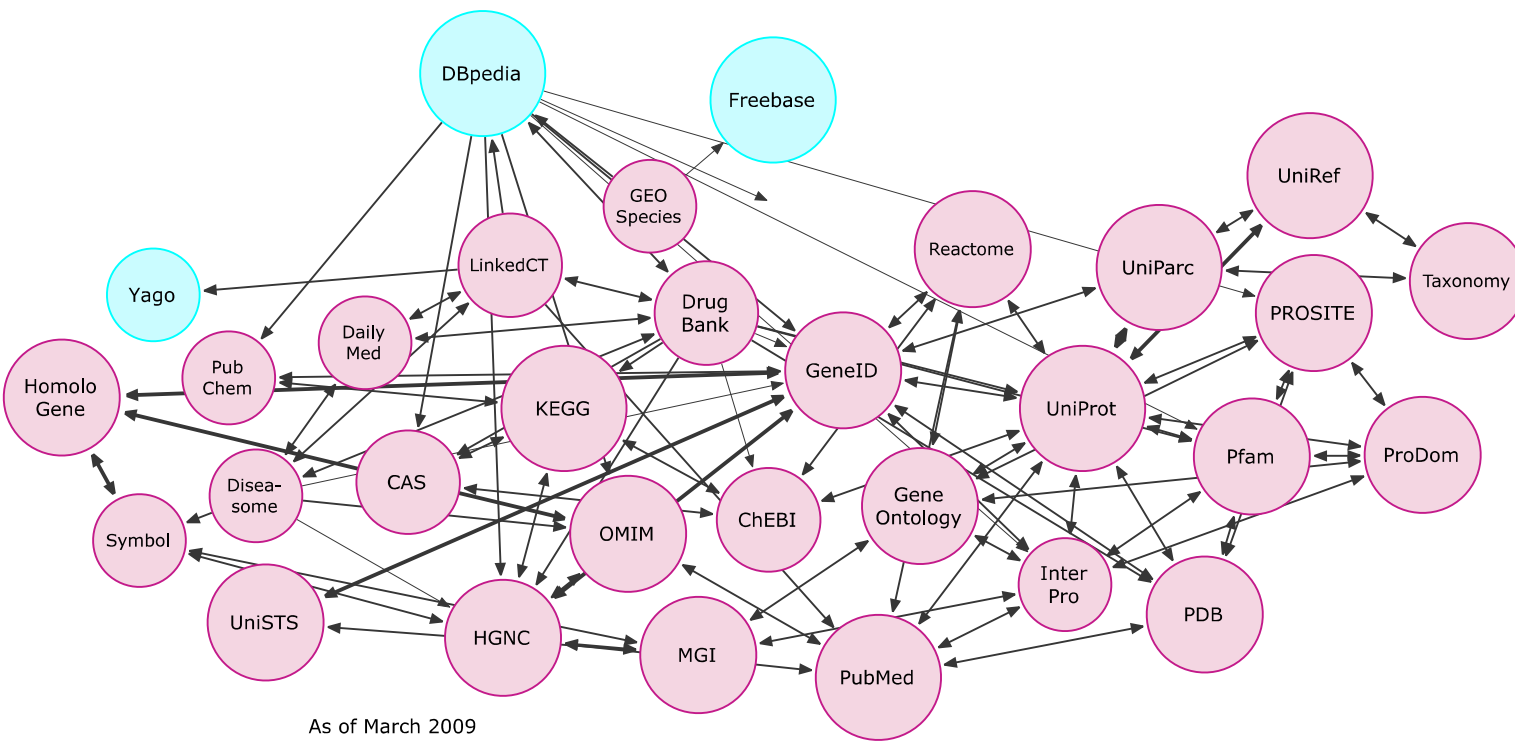
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As of March 2009

HCLS in LOD cloud

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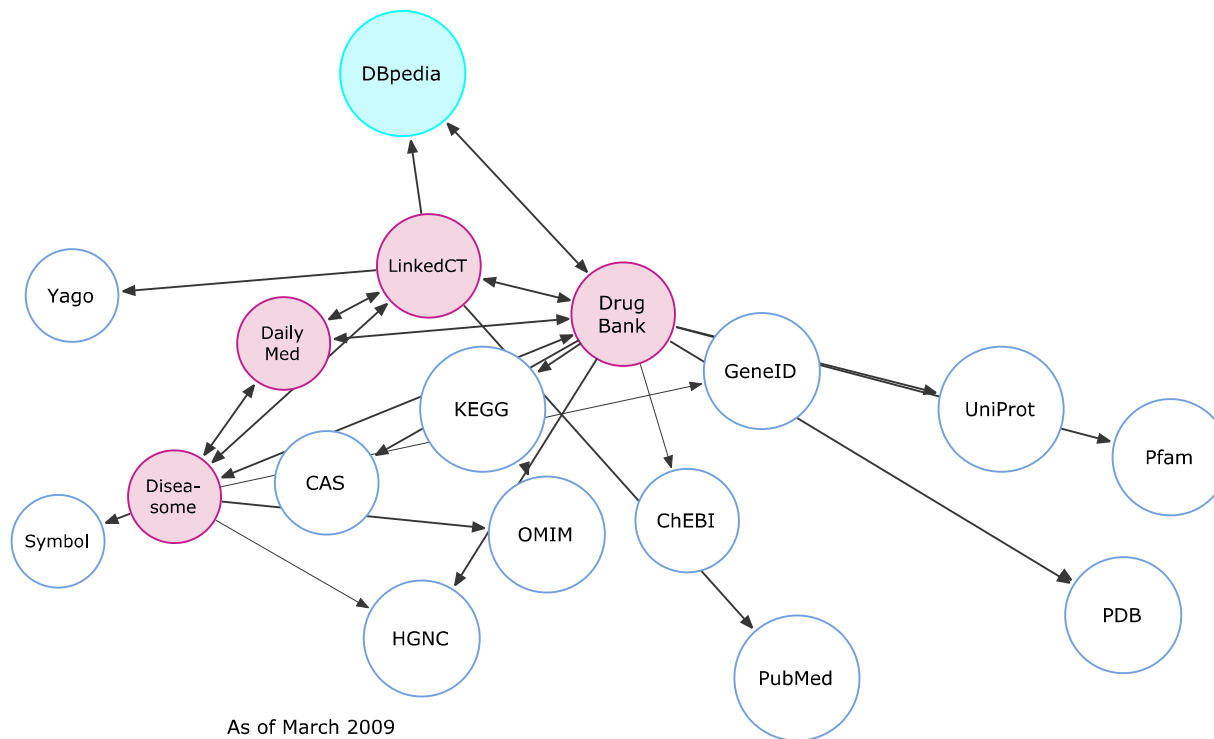


LODD in LOD cloud

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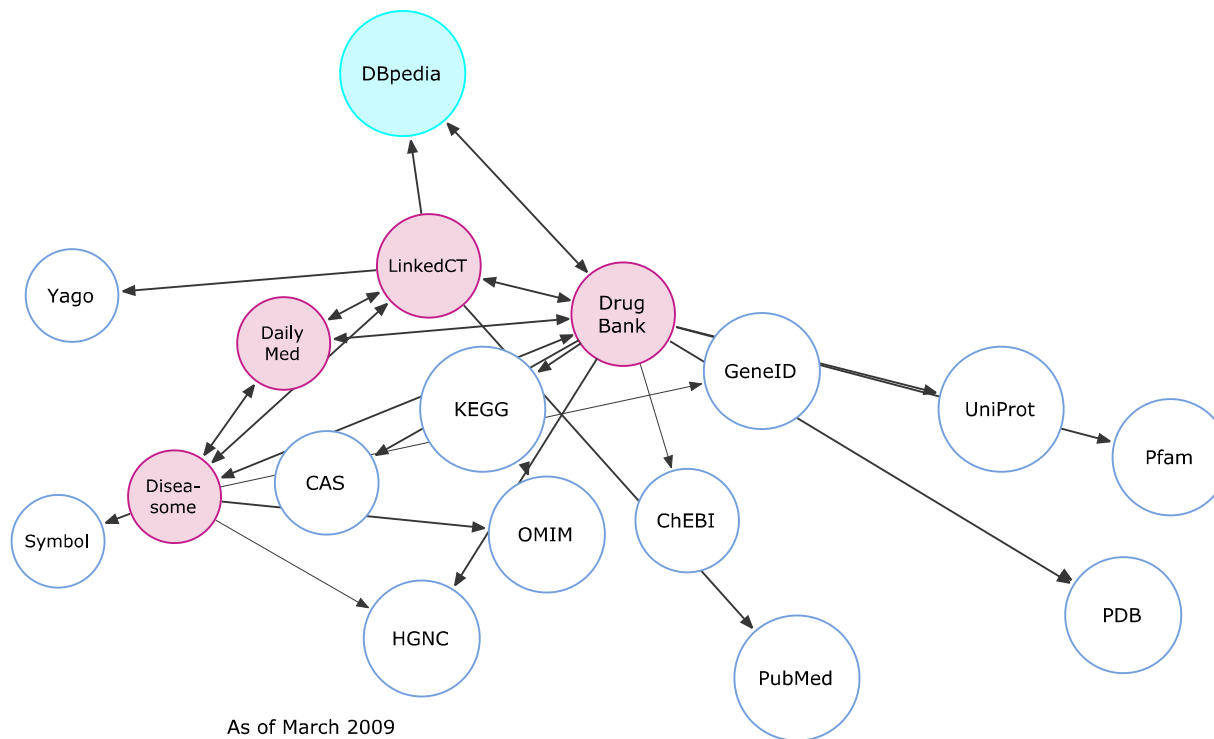
Published Data Sets

- LinkedCT
- Diseasome
- DailyMed
- DrugBank



LODD in LOD cloud

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- Interlinked to:
 - ▣ DBpedia/YAGO
 - ▣ Symbol
 - ▣ CAS
 - ▣ HGNC
 - ▣ KEGG
 - ▣ OMIM
 - ▣ ChEBI
 - ▣ GeneID
 - ▣ PubMed
 - ▣ UniProt
 - ▣ Pfam
 - ▣ PDB

Published Datasets

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□ LinkedCT

<http://linkedct.org>

□ From ClinicalTrials.gov

- Online registry of clinical trials conducted in the United States and around the world
- Published in XML

□ More than 60,000 trials

□ 7,011,000 triples

□ DrugBank

<http://www4.wiwiss.fu-berlin.de/drugbank/>

□ A repository of almost 5000 FDA-approved small molecule and biotech drugs

- Published as DrugBank DrugCards

□ 1,153,000 triples

Published Datasets

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- DailyMed

<http://www4.wiwiss.fu-berlin.de/dailymed/>

- High quality information about marketed drugs
 - Published by the National Library of Medicine
 - In a flat file representation
- 124,000 triples

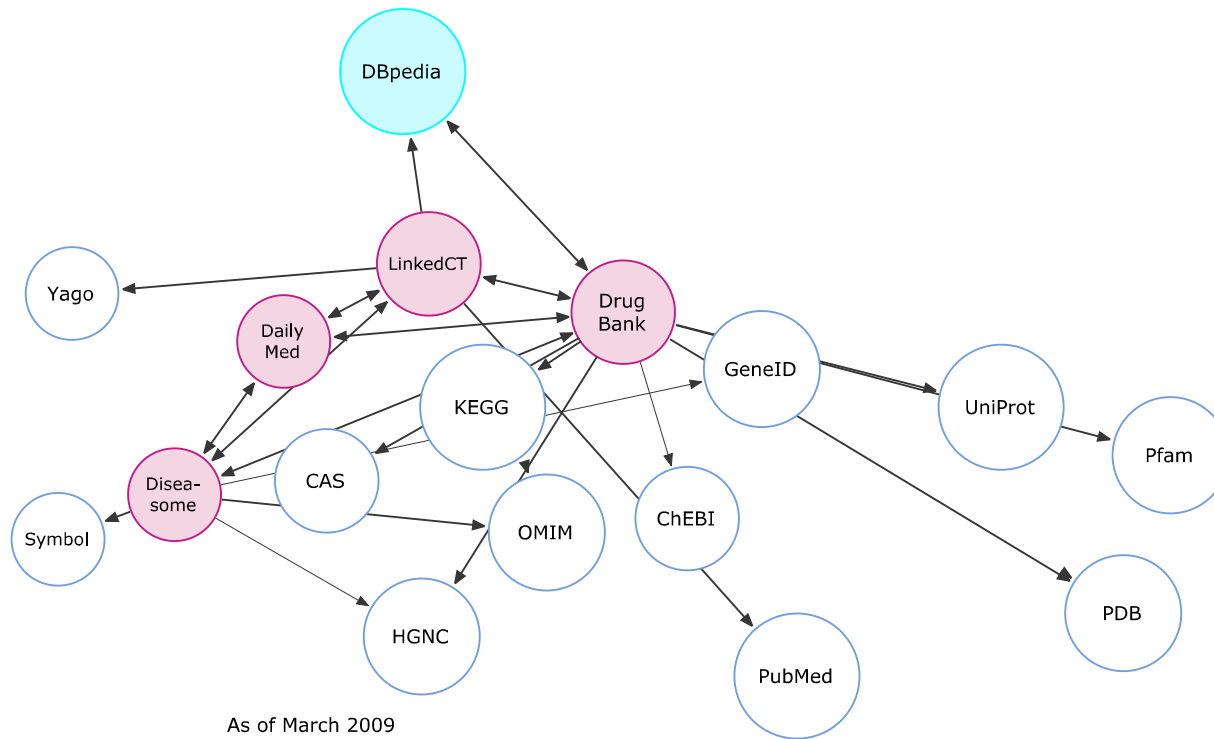
- Diseasome

<http://www4.wiwiss.fu-berlin.de/diseasome/>

- Information about 4,300 disorders and disease genes linked by known disorder–gene associations
 - Published in Structured Product Labeling (an XML-based standard for exchanging medication information)
- 88,000 triples

Interlinking Datasets

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- Two classes of links
 - ▣ Based on common identifiers
 - Links present in the source data sets
 - ▣ Based on link discovery and record linkage techniques
 - String matching
 - Semantic matching

Interlinking Datasets

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- Link discovery techniques
 - String matching
 - Linking LinkedCT and Disеasome
 - E.g., "Alzheimer's disease" in LinkedCT was matched with "Alzheimer_disease" in Disеasome
 - Semantic matching
 - Many drugs and diseases have multiple names
 - E.g., "Varenicline" has the synonym "Varenicline Tartrate" and the brand names "Champix" and "Chantix"

Interlinking Statistics

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Data set	Number of links
LinkedCT	290,000 links; 50,000 of them inside the LODD cloud
DrugBank	23,000 links; 8,500 of them inside the LODD cloud
DailyMed	29,600 links; all of them inside the LODD cloud
Diseasome	23,000 links; 8,400 of them inside the LODD cloud
Total	365,600 links; 8.4 million triples

Business Use Cases

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- <http://esw.w3.org/topic/HCLSIG/LODD/Business>
- Example competitive intelligence use case
 - A neuroscience focused business manager interested in seeing an update on new clinical trials by competitors on Alzheimer's Disease (AD).
 - A phase III trial by Pfizer for a drug called Varenicline
<http://data.linkedct.org/resource/trials/NCT00744978>
 - More information about the drug on DBpedia, DailyMed and DrugBank
 - <http://dbpedia.org/resource/Varenicline>
 - <http://www4.wiwiss.fu-berlin.de/drugbank/resource/drugs/DB01273>
 - DailyMed indicates the drug is already on the market for Nicotine addiction
 - Possible side effects are listed for the typical dose
 - According to LinkedCT, the dose in the trial is no more than the typical dose

Business Use Cases

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- Why a nicotine addiction drug might work for AD?
 - DrugBank allows the manager to find drug targets “Neuronal acetylcholine receptor subunit alpha-4” and “Neuronal acetylcholine receptor subunit alpha-7” and associated gene names
 - Diseasome, however, indicates that the corresponding genes are only important in nicotine addiction, rather than AD.
 - This suggests that there is a more complex relationship between the diseases, than just sharing a drug target.
 - Extending the browsing to the SWAN Knowledgebase* shows that there are hypotheses relating AD to nicotinic receptors through amyloid beta.
 - * <http://hypothesis.alzforum.org/swan/>

Conclusion and Future Work

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- Extending the LOD cloud with HCLS datasets
 - ▣ Focus on clinical and pharmaceutical data sources
- Identify missing datasets and linkage points
 - ▣ By developing business use cases by pharmaceutical researchers
- Interlinking of the datasets
 - ▣ Using novel link discovery tools and frameworks including Silk and LinQuer
- Evaluating linked data exploration interfaces

The End

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□ Thank you!