Striving for semantic harmony across datasets, communities, and real-world data

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Semantic harmony

- Consistent representation of data and what the data is about using ontology terms.
- Consistent development, management and application of ontologies.
- Balance of "we need it now" pragmatism and "do it correctly" formalism.



Cocoa and Emma as yin-yang



Ontologies* can support different aspects / multiple dimensions of standardization at the same time



defined terms with IRIs

• Not everyone needs to work in all dimensions but a better understanding of each will make for better usage.

* See Rector et al.: On beyond Gruber: "Ontologies" in today's biomedical information systems and the limits of OWL. J Biomed Inform. 2019;100S:100002.

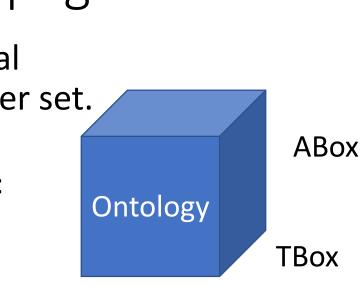
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Definitions to get us on the same page

- Internationalized Resource Identifier (IRI). A Universal Resource Identifier or URI with an expanded character set.
 - Identifiers for finding things on the internet.

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- e.g. http://purl.obolibrary.org/obo/OBI_0000070 or OBO: OBI_0000070
- Ontology terms are more than just the label (like "assay")
- TBox (terminology): Expressions that contain universal statements about classes *
- ABox (assertion): Expressions that contain assertions about instances *



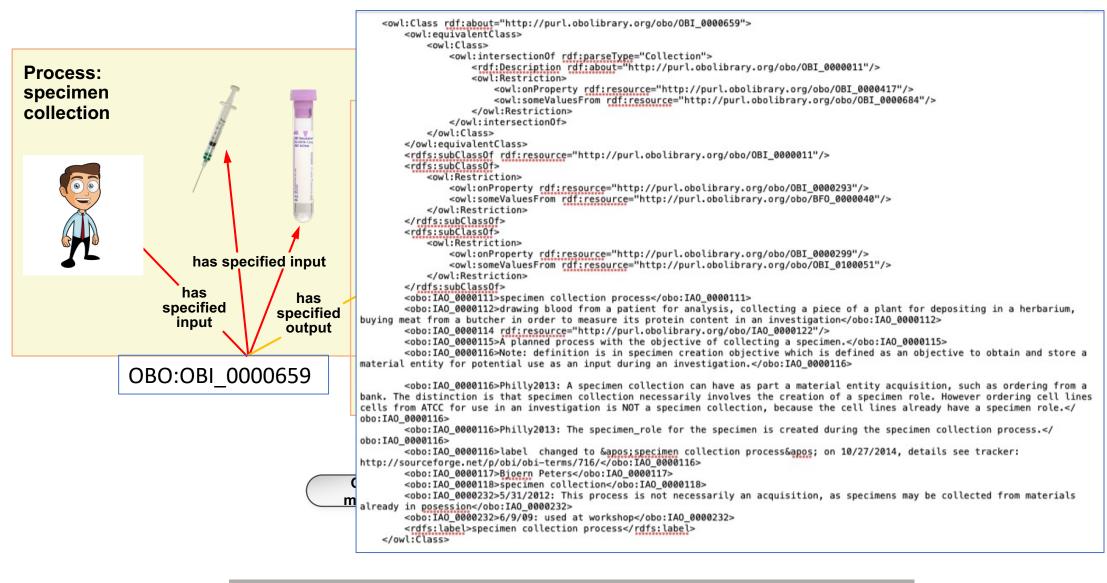
IRIs

* L. Vogt Journal Biomedical Semantics 2021 12:20



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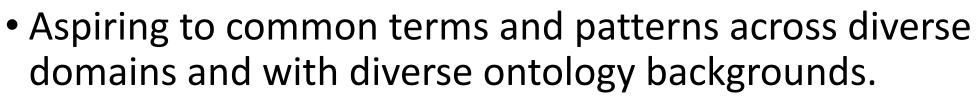
Referring to reality: IRIs and classes (TBox) and instances (ABox)



Bandrowski et al. The Ontology for Biomedical Investigations. PLoS One 2016

Semantic harmony for databases, community standards, and graphs

- Striving for semantic harmony in a large project with a small ontology team
 - The VEuPathDB story (annotations, IRIs)



- OBI/OBO Foundry (classes, TBox)
- Applying ontology-driven tools on real-world data
 - TURBO and semantic graphs (individuals, ABox triples)



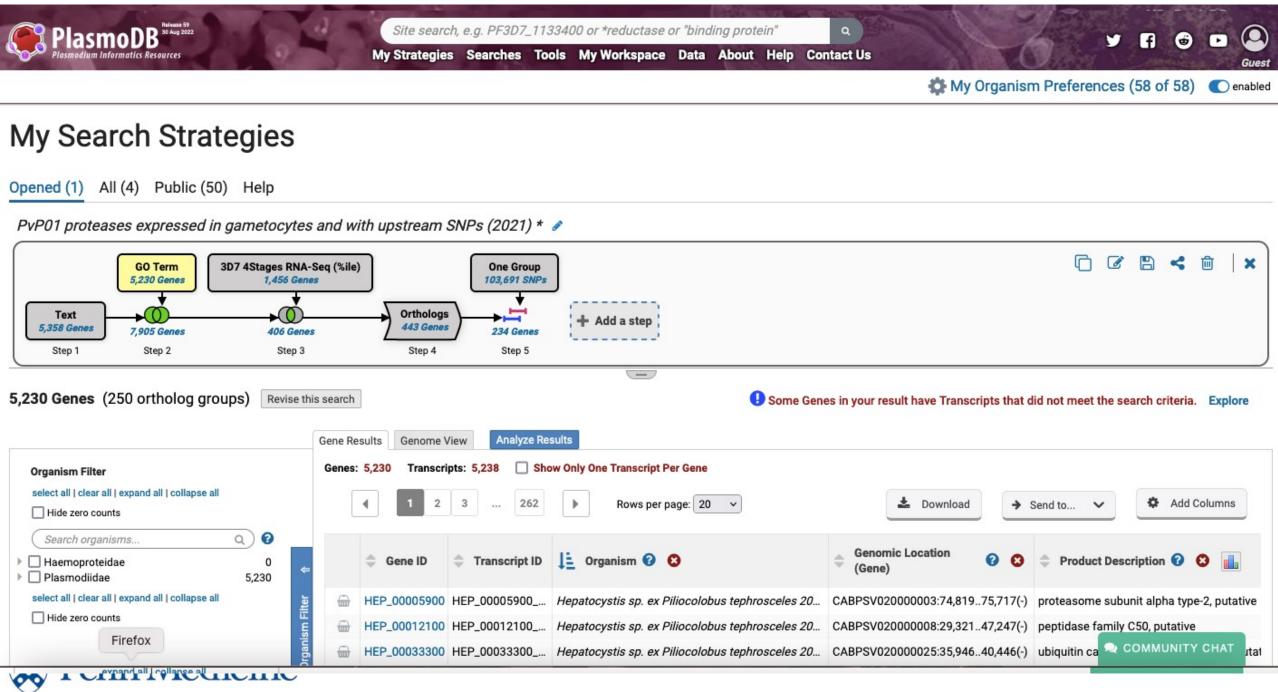




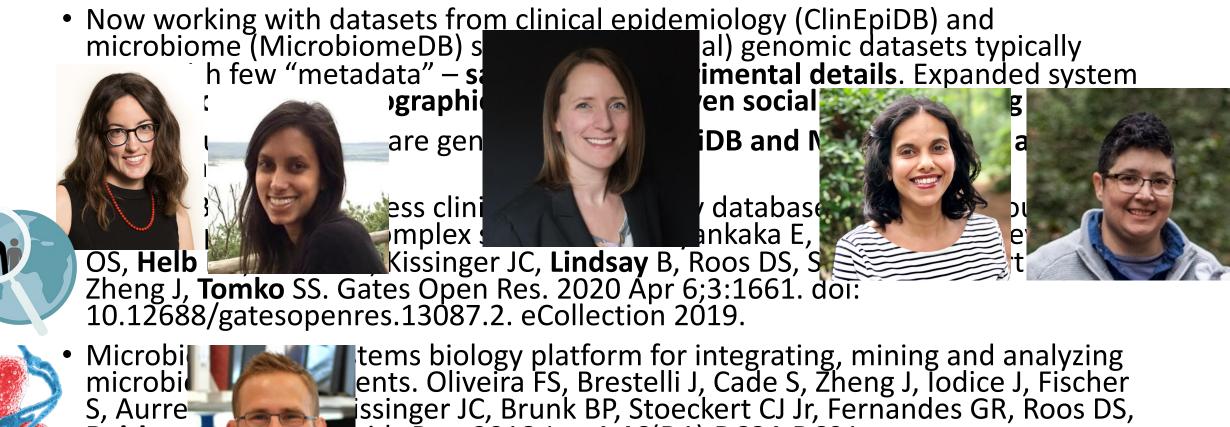
VEuPathDB is a collection of eukaryotic pathogen, vector, and host informatics resources

- Primarily an NIAID-supported Bioinformatics Resource Center.
- Also funding from Wellcome Trust. Now an Elixir-UK service selected to ensure high service quality and match UK priorities as identified by its funders.
- Started in 2000 with the Plasmodium Genome Database PlasmoDB (reflects a long running project) to provide researchers studying provide researchers.





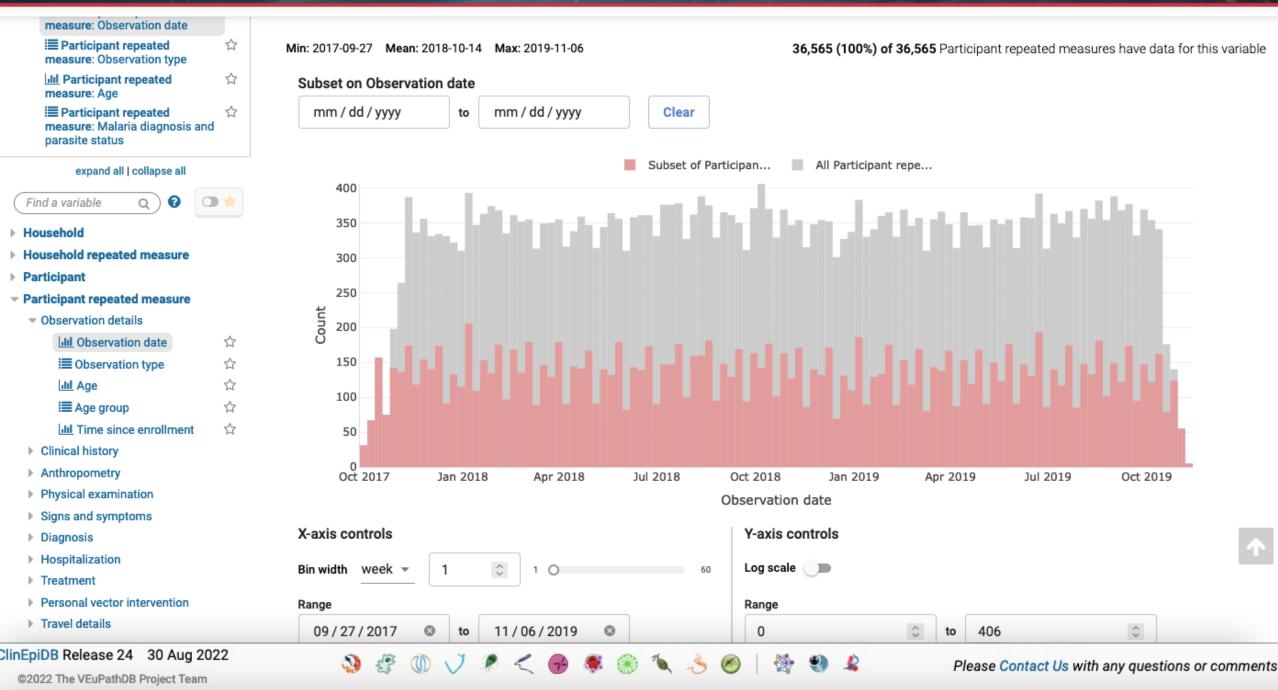
VEuPathDB has expanded to include ClinEpiDB and MicrobiomeDB



cids Res. 2018 Jan 4;46(D1):D684-D691.

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Beiting



Prevalence of microscopic or submicroscopic parasitemia 🥒 Line Plot Y-axis aggregation 😧 Axis variables Stratification variables X-axis* Observation date 🗨 Select a variable 🗨 Overlay Age group 🔻 Facet \bigcirc Proportion Median Mean Include Samples with no data for selected stratification variable(s) Y-axis* Plasmodium, by qPCR -Positive -Proportion* = Negative, Positive 🔻 12,727 Samples Human dwelling Household_ID Dwelling type [ENVO_01000744] Floor material [EUPATH_0000006] Wall material [EUPATH_0000009] Roof material [EUPATH_0000003] 1 Eaves [ENVO_01000825] Thatched (including papyrus) 101008404 Traditional Earth and dung Mud and poles 2 Open 3 101009801 Traditional Earth and dung Burnt bricks with mud Iron sheets Closed 102018901 Traditional Earth and dung Mud and poles Iron sheets Closed 4 5 103007901 Traditional Earth and dung Mud and poles Iron sheets Closed 103015402 Modern Earth and dung Burnt bricks with plaster/cement Iron sheets Closed 6 0.2 0 Data for axes & strata Data for axes Subset 0.15 Proportion All 10,000 20,000 0 30,000 0.1 Samples 0.05 Variable Data No data 0 X-axis Observation date 14,702 0 (100.00%) (0.00%) -0.05Plasmodium, by qPCR 12,727 1,975 Y-axis

Jul 2019

Jan 2020

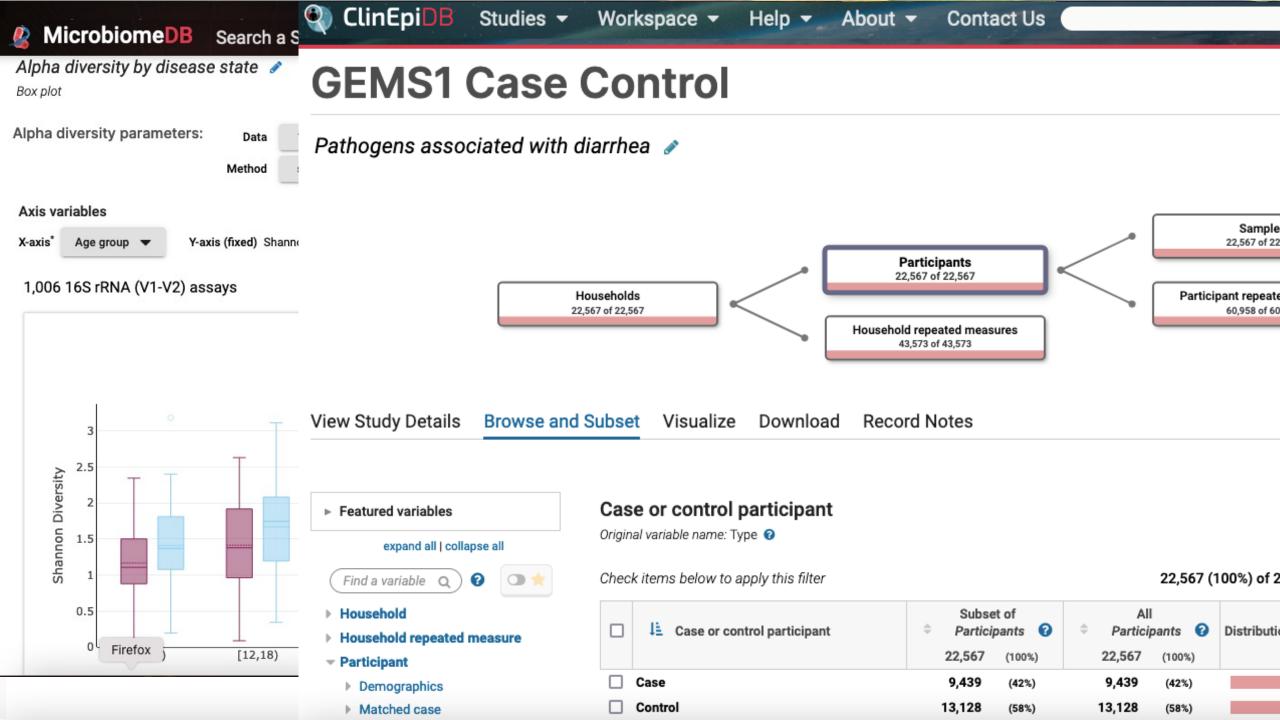
(87.00%)

(13.00%)

Jan 2019

Jan 2018

Jul 2018

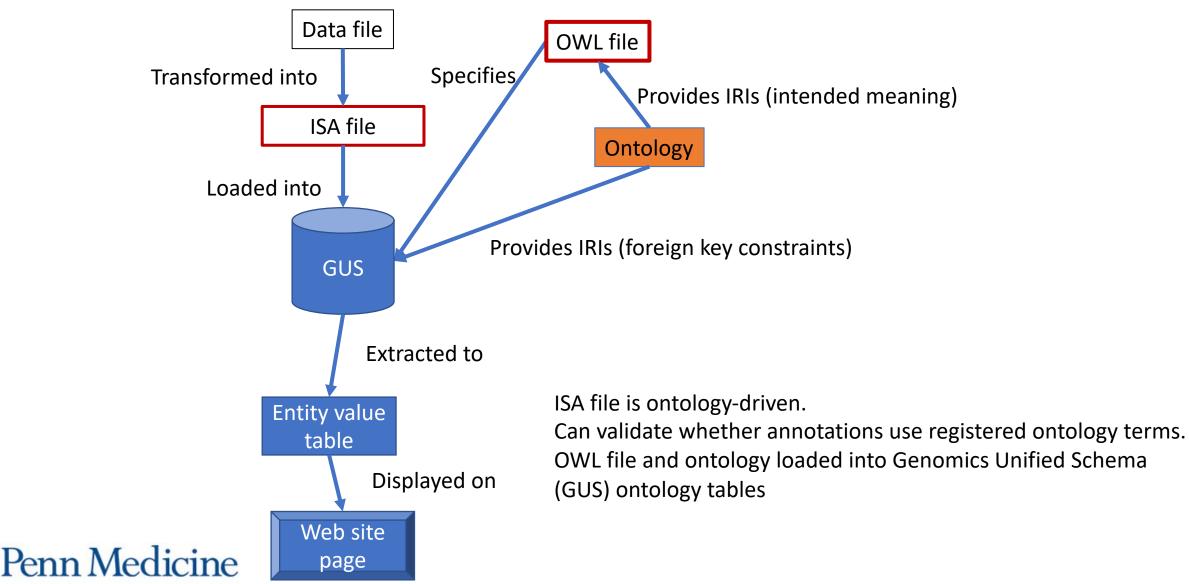


VEuPathDB Ontology supports the harmonization of annotations/data variables for genomic, epidemiological, and microbiome datasets

- All annotations/data variables with the same label are equivalent and have the same IRI
- Data variables are organized following the same web display hierarchy across sites (not the same as the ontology hierarchy).
- Goal is to provide consistency (i.e., semantic harmony) terms have the same meaning everywhere and can be found in the same way.



Semantic consistency of VEuPathDB dataset annotations is ontology-driven through "harmony" of IRIs during data loading



https://obofoundry.org/ontology/eupath.html

An ontology is developed to support Eukaryotic Pathogen, Host & Vector Genomics Resource (VEuPathDB; https://veupathdb.org).

OntoBee AberOWL OLS Bioregistry

The VEuPathDB ontology is an application ontology developed to encode our understanding of what data is about in the public resources developed and maintained by the Eukaryotic Pathogen, Host & Vector Genomics Resource (VEuPathDB; https://veupathdb.org). The VEuPathDB ontology was previously named the EuPathDB ontology prior to EuPathDB joining with VectorBase. The ontology was built based on the Ontology of Biomedical Investigations (OBI) with integration of other OBO ontologies such as PATO, OGMS, DO, etc. as needed for coverage. Currently the VEuPath ontology is primarily intended to be used for support of the VEuPathDB sites. Terms with VEuPathDB ontology IDs that are not specific to VEuPathDB will be submitted to OBO Foundry ontologies for subsequent import and replacement of those terms when they are available.

Publications

Malaria study data integration and information retrieval based on OBO Foundry ontologies.

Products

eupath.owl

Usages User Description Type annotation and query Usages User Description User Description

ID Space	eupath
PURL	http://purl.obolibrary.org
	/obo/eupath.owl
License	CC BY 4.0
Homepage	https://github.com
	/VEuPathDB-ontology
	/VEuPathDB-ontology
Contact	Jie Zheng
Tracker	https://github.com
	/VEuPathDB-ontology
	/VEuPathDB-ontology
	/issues
Domain	organisms
Stars	stars 5
Contributors	contributors 5
Last Commit	last commit today

View Edit PURL

Generated by: _layouts/ontology_detail.html See metadata guide



Make commands

(

jie zheng edited this page on Nov 22, 2021 · 5 revisions

make imports	- Pages 7
make modules	
make test	Find a page
• make	▶ Home
make clean	
make imports	 Annotation properties used in ClinEpi studies
Update import OWL files using OntoFox	 Deprecation of VEuPathDB ontology term
1. Update the local git repository	Design patterns
2. Update the Ontofox input files that is under /src/ontology/OntoFox-input	 Make commands
3. Run make imports, it will generate the OWL file if any OntoFox-input file(s) updated using OntoFox	make imports
and make the base file to reduce inconsistency	make modules
Note: Generally it will automatically identify which OntoFox input file has been changed and only	make test
update that import OWL file	make
4. Run make -B imports, it will force to generate all import OWL files based on the OntoFox input files	make clean
no matter they have been changed or not.	Make VEuPathDB ontology release
5. The import_UO_instance.owl cannot be regenerated using make imports, since the UO defined some	

terms as both classes and instances. Some edits need to be made manually as follow:

Naming conventions

Release made on 2022-08-12 Latest

This release introduces 95 new VEuPath terms and 49 additional imported labels and definitions and expanding documentation. Changes are now linke issues.

What's Changed

	1	ID	Label
t	2	EUPATH:0000662	BMI-for-age z-score
e	3	EUPATH:0000814	presence of organism in placental blood
	4	EUPATH:0010049	case participant identifier
	5	EUPATH:0011649	indicator of dairy food product consumption yesterday
	6	EUPATH:0011958	presence of Vibrio in feces

is-a

is-a

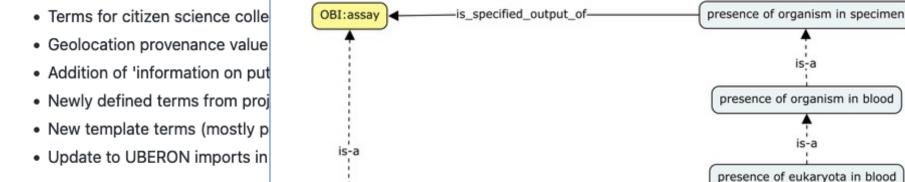
presence of Plasmodium in blood by microscopy assay

OBI:organism

is-a

is about

Additional terms



OBI:microscopy assay

-is specified output of-

Cleanup and normalization

Label and definition normalization

- Normalize and add axioms to chagnes categories in moor
- Fixes to indicator terms under 'household asset information' in #376
- Update to terms for time spent in an occupation in #377
- Typo fixes and corrections to specimen collection terms in #379
- Update to diagnosis term labels/definitions in #382
- Normalize information content entity labels in #384
- Domovo term missing definition (to be rectored in future release) in #20

15	EUPATH:0015718	presence of Clostridioides in feces
16	EUPATH:0015719	presence of Helicobacter in feces
17	EUPATH:0021084	indicator of household having electricity
18	EUPATH:0021103	indicator of medication administered during health care encounter

The VEuPathDB Ontology is an application ontology supporting VEuPathDB resources

- Not trying to capture parasite biology. Employs other ontologies like the the Ontology of Parasite Lifecycles (OPL) to do that.
- Primarily reuses terms from OBO Foundry. Imports terms from over 50 sources.
- However, ~1900 terms out of ~5000 have EUPATH prefix (created by VEuPathDB) so there are a lot of terms only in the VEuPathDB ontology!
- Many of these are placeholders. Active effort to get these in domain / reference ontologies.
- Many are precomposed terms reflecting researcher-based distinctions.
 - E.g. 'presence of Plasmodium in blood by microscopy assay', 'specimen used for DNA PCR'
 - Universal or arbitrary grouping?



What is the value of having this VEuPathDB "application" ontology in the OBO Foundry?

- DISCLAIMER: These are my views and don't reflect the OBO Foundry!
- Provides a basis for shared terms typically to be put in a domain/ reference ontology.
 - Get to share how we are ontologizing data from surveys and case report forms.
 - Show the design patterns we've come up with and naming conventions.
- Is it ever OK to reuse our classes outside our projects? Why do we have them?
 - Need terms for database releases on different schedule from external ontology releases.
 - Contact us if you have need for the same term and we'll work together to get it in the most relevant ontology. E.g., OBI, ENVO, OMRSE, PRO
- Note this raises the issue of ontology class expressions (TBox) for 'universals' as opposed to arbitrary groupings.
 - Do classes for arbitrary groupings belong in reference ontologies?
 - Probably not, but do need a home because still be of general use and therefore has value for reuse.



Aspiring to common terms and patterns across diverse domains and diverse ontology backgrounds with OBI



- OBI is the Ontology for Biomedical Investigations and arose initially from the MGED ontology to cover microarray assays and then FuGO, functional genomics ontology.
 - Recognition that different technologies generating large datasets had a common need to describe experimental conditions, protocols, and designs.

Investigations

 The same specimens could be used for transcriptomics, proteomics, and metabolomics experiments.



Think OBI first when developing ontology terms related to peforming research!



- Get broader input, more likely to be interoperable, and bigger impact
- Weekly meetings where you can champion your terms
- Not just an issue tracker but also GitHub pull requests (can track your terms!)

Investigations

- Vita R, Zheng J, Jackson R, Dooley D, Overton JA, Miller MA, Berrios DC, Scheuermann RH, He Y, McGinty HK, Brochhausen M, Lin AY, Jain SB, Chibucos MC, Judkins J, Giglio MG, Feng IY, Burns G, Brush MH, Peters B, Stoeckert CJ Jr. Standardization of assay representation in the Ontology for Biomedical Investigations. Database (Oxford). 2021 Jul 9;2021:baab040.
 - Design patterns and ROBOT templates
 - Working together to share and apply best practices
 - "Both the ontology terms and the OBI community were improved through this collaborative community effort, which made developers more aware of terms outside their area of expertise and gave them a better understanding of assay terms as a whole."



http://obi-ontology.org/

Term Guidelines Projects Media Documentation 2022 Workshop

OBI

Ontology for Biomedical Investigations

Community Standard for Scientific Data Integration

Contact Us

- OBI users mailing list obi-users@googlegroups.com on Google Groups.
- OBI developers mailing list obi-devel@lists.sourceforge.net (subscription form)
- issue tracker: https://github.com/obi-ontology/obi/issues
- weekly conference call, Mondays at 9:00 AM Pacific, 12:00 noon Eastern
 - Zoom web conference https://us02web.zoom.us

/j/82952846229?pwd=UXkwZ3RmU1VZUEM3bDINS1RsSzNzdz09

- by phone: +1 408 638 0968 (US Toll) or +1 646 558 8656 (US Toll), Meeting ID: 829 5284 6229, Passcode: 535959 International numbers available
- weekly agenda Google Doc

OBI

Robot Templates

Term Guidelines Projects Media Documentation 2022 Workshop

OBI Core Core Classes

Data Modelling

Introduction

12

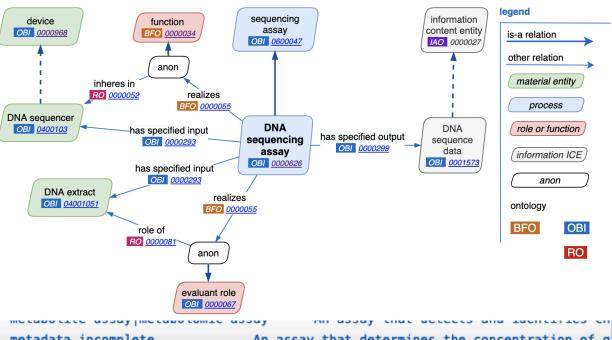
ROBOT Templates

editor preferred term has curation status ontology ID label TD A rdfs:label 2 fluorescence microscopy assay CHM0:0000087 3 confocal fluorescence microscopy assay CHM0:000089 4 CHM0:0000102 light microscopy assay Bernoulli trial pending final vetting OBI:0000117 NMR 3D molecular structure determination assay OBI:0000182 OBI:0000185 imaging assay pending final vetting 8 OBI:0000201 radioactivity detection 9 OBI:0000288 protein-protein interaction detection assay 10 OBI:0000291 transcription factor binding site assay 11 OBI:0000366 metabolite profiling assay metadata complete 12

OBT . 0000/19 measuring alucase concentration in blood serum assay

We use **ROBOT templates** to convert spreadsheets of highly patterned term specifications to OWL. They are provided in the src/ontology/templates/ folder:

- assays.tsv for general assays
 - epitope-assays.tsv specifically for immune epitope assays
- biobank-specimens.tsv
- medical-history.tsv for medical history classifications and related selection criteria
- sequence-analysis.tsv
- study-designs.tsv
- value-specifications.tsv
- obsolete.tsv for obsolete terms alter A editor preferred term AI has curation status A alte fluorescence CLSM (light microscopy OM | o An as:
 - An as: An assay that metada metadata comp



Aspiring to common terms and patterns across diverse domains and ontology backgrounds with the OBO Foundry

- OBO Foundry (OBOF) arose to provide interoperability for ontologies covering different domains
 - Requires principles for building and documenting the ontologies
 - Benefits from a common upper level and relations
 - Mainly for reference ontologies but many project-based ontologies have become involved
- Ontologies for complex data can cross many domains and require a metacommunity like the OBOF to get coverage at least at a mid to upper level.
- OBO Foundry arose out of a recognition that communities should work together on ontologies.



OBOF is about representing what happened in reality not how things are stored in a database (or "cognitive representations on the part of domain experts").*

- BFO (Basic Formal Ontology) provides an upper level ontology to distinguish between material entities, processes, and information.
 - Now an ISO standard (in First Order Logic not just OWL, thank you Alan Ruttenberg!)
 - Not the only upper level ontology and not everyone is happy about exposing non-ontologists to 'continuants' and 'occurrents' so still part of the struggle for semantic harmony across communities.
- But we all use the Relations Ontology (RO)!

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- A requirement for being part of the OBO Foundry.
- Connections (object properties) between ontology terms are often between different domains and RO provides the primary ones.
- RO used in TBox definitions but are for ABox assertions on Instances of classes

* Ceusters, Smith. A realism-based approach to the evolution of biomedical ontologies. AMIA Annu Symp Proc. 2006;2006:121-5.

Class: process

Term IRI: ht	tp://purl	.obolibrary	.org	/obo/BFO	0000015	
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Class Hierarchy

Thing

- + material entity
- + immaterial entity
- obsolete_elementary charge
- obsolete macromolecular entity
- K + information
 - + characteristic
- o process

А

Ν

- + planned process
- environmental process
- gene product or complex activity
- biological process
- physico-chemical process
- disease course

Superclasses & Asserted Axioms

- http://www.w3.org/2002/07/owl#Thing
- part of only process

Uses in this ontology

process subClassOf : part of only process

This Class is originally defined in

Ontology listed in Ontobee	Ontology OWL file	View class in context	Project home page
Basic Formal Ontology	<u>bfo.owl</u>	'process' in bfo.owl	Project home page

Ontologies that use the Class

Ontology listed in Ontobee	Ontology OWL file	View class in context	Project home page
FOODON	foodon.owl	'process' in foodon.owl	Project home page
PPotoin Ontology (PPO)	DE OWI	'process' in provid	Project home page



ative

Harmonizing communities: OBO Foundry

- Longstanding mechanisms for participation.
 - OBOF web site
 - OBO-discuss mail list
 - Meetings like ICBO





Harmonizing communities: OBO Foundry

- New ways to be part of the community.
 - Slack https://obo-communitygroup.slack.com
 - >50 channels! >240 members in the general channel!
 - Ontologies (e.g., COB), technologies (e.g., SPARQL), tools (e.g., ODK), resources (e.g., Jobs)
 - Governance
 - On-line resources
 - Tool tutorials
 - OBO Semantic Engineering Training <u>https://oboacademy.github.io/obook/</u> (Open Biological and Biomedical Ontologies Organized Knowledge)
- Please attend the OBO Foundry Town Hall on Wednesday afternoon, Sept. 28.
 - Operations Committee
 - Governance



Ontology Tools

 Ontology Development Kit (ODK): A toolkit for initializing a new ontology repository. The template includes a structured directory, a Makefile with automated release workflows, continuous integration testing, and full documentation. t

- ROBOT: A command line tool to automate ontology workflows. It includes commands that can be used manually or integrated in automated processes to develop and release ontologies.
- Protégé: An ontology editing environment for OWL ontologies. It allows developers to visualize the ontology hierarchy, add
 and edit ontology terms, reason over the ontology, and more.
- Onto-Animals: Tools to extract external ontology terms, compare ontologies, edit ontology terms, query and visualize ontologies, and more.
- VOCOL: An integrated environment for collaborative vocabulary development
- Karma Data Integration: A data integration tool
- · Ontofox: An ontology term and relation extraction and reuse tool
- Ubergraph: A sparql endpoint with many OBO ontologies loaded and pre-reasoned with simple triples materialized

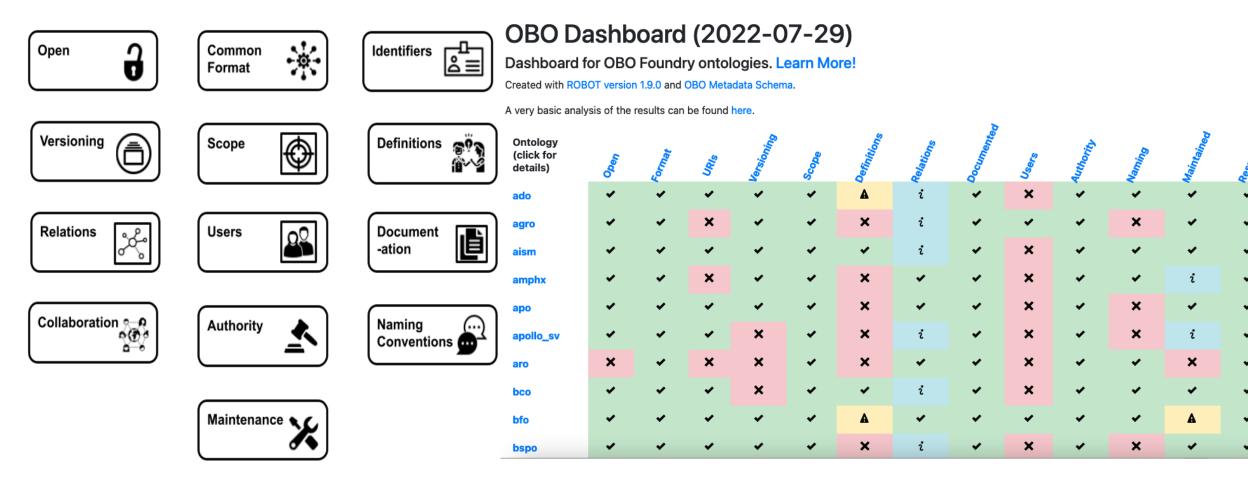
Ontology Analysis

- OBO Dashboard: An assessment of OBO Foundry ontologies' conformance to OBO Foundry principles
- OBO Community Health Report: A self-updating assessment of the quality of metadata, responsiveness of the maintainers, and the overall community engagement for each OBO Foundry ontology.
- Ontology Quality Assessment: A self-updating assessment of the semantic quality of OBO Foundry ontologies and beyond (using known prefixes, using standard identifiers, etc.)

Relevant Publications/blogs

- OBO Foundry in 2021: operationalizing open data principles to evaluate ontologies (2021). Rebecca Jackson, Nicolas Matentzoglu, James A Overton, Randi Vita, James P Balhoff, Pier Luigi Buttigieg, Seth Carbon, Melanie Courtot, Alexander D Diehl, Damion M Dooley, William D Duncan, Nomi L Harris, Melissa A Haendel, Suzanna E Lewis, Darren A Natale, David Osumi-Sutherland, Alan Ruttenberg, Lynn M Schriml, Barry Smith, Christian J Stoeckert Jr., Nicole A Vasilevsky, Ramona L Walls, Jie Zheng, Christopher J Mungall, Bjoern Peters. *Database*, Volume 2021, baab069, https://doi.org/10.1093/database /baab069
- The OBO Foundry: coordinated evolution of ontologies to support biomedical data integration (Smith et al., 2007). Nat Biotechnol 2007 Nov;25(11):1251–1255. http://dx.doi.org/10.1038/nbt1346
- MIRO: guidelines for minimum information for the reporting of an ontology (2018). Nicolas Matentzoglu, James Malone, Chris Mungall and Robert Stevens, Journal of Biomedical Semantics 2018 9:6, https://doi.org/10.1186/s13326-017-0172-7

OBO Foundry recent activities have included working on operationalizing principles



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Challenge of interoperating with other communities

- Criteria for joining the OBO Foundry.
 - Scope: Use case relevant to life sciences.
 - Balance of inclusion and quality.

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- SOP for reviewers on new ontology requests is now available at https://obofoundry.org/docs/SOP.html (open for improvement).
- Ontology / Semantic web communities:
 - Interoperability of OBOF principles and tools with other standards.
 - What are they? What are current connections? ENVO yes but Financial Industry Business Ontology (FIBO)? SNOMED? FHIR?
 - Presence at ICBO / joint conferences (e.g., with US2TS this year) has been a step in the right direction but unclear what progress comes of that.

Applying ontology-driven tools on real-world data: The TURBO story

- Real-World Data (RWD): "data relating to patient health status and/or the delivery of health care routinely collected from a variety of sources."
 - https://www.fda.gov/science-research/science-and-research-specialtopics/real-world-evidence
 - Also RWD is typically messy! (inconsistent in use of fields and incomplete)
- Billing codes (ICD) and problem lists (SNOMED, LOINC) capture the category for describing the patient diagnoses and findings but don't provide a representation of the patient and the clinical experience (or a biobank specimen and its history and status).
- Biobank and clinical data needs harmonization and integration with other data and are **focused on individuals** so a good ABox fit.

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Real-world data on individuals can best be represented as triples and captured as graphs

- Including relations enables making explicit the implicit connections between data records.
 - Triples provide a mechanism to accomplish this:
 - <subject> <predicate> <object>

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- <patient1> obo:RO_0000056#participates_in <HCE1>
- <HCE1> rdfs:type <obo:OGMS_0000097#'health care encounter'>



• Transforms data from different sources (and typically different schemas) to a common representation of what happened in the real world.

Ceusters. The place of Referent Tracking in Biomedical Informatics https://osf.io/q8hts/

participates in

patient1

HCE1

Health care

encountei

type

PennTURBO aims to facilitate clinical research through semantically rich representations of RWD



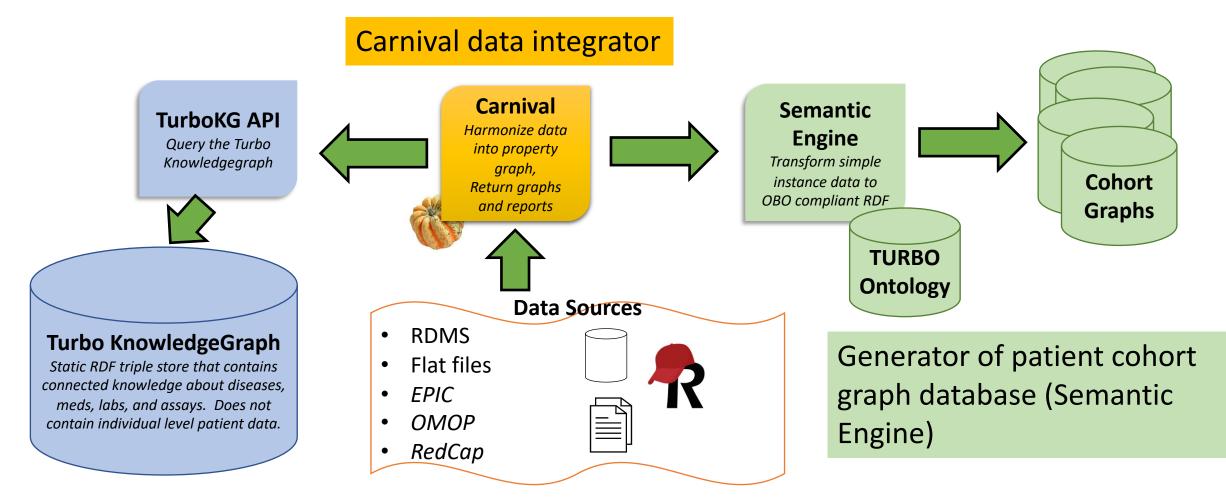
Transform relational data to graphs gaining flexibility of queries **Unify** data from different sources through alignment to reality (what data is about) **Research** is supported by tracking provenance of data processing and integration **Biomedical Ontologies** provide computable hierarchies and connections.

TURBO can find patients based on demographics (e.g., sex, BMI), diagnosis related to a disease class (e.g., lung cancer), medications prescribed (e.g., opioid orders), lab test results (e.g., blood glucose measurements), and representation in specific resources (e.g., Penn Medicine Biobank, the Penn Cancer Registry).



TURBO

PennTURBO is comprised of three major components: Carnival, Knowledge graphs, and the Semantic Engine.



Knowledgegraphs linking ontologies to searchable fields in EHR

The Semantic Engine uses a graph specification for allowable triples based on the TURBO Ontology

- Application ontology that imports terms from > 20 OBOF ontologies.
- Also includes TURBO project terms
 - "TURBO assertion making process" : A planned process that takes a datum as input and has a rdf:Statement as output. (used to track various recodings)
- Originally built using Ontodog (started based on the Ontology for Biobanking - OBIB) and Ontofox (for imports).
- Made a release this year with the Ontology Development Kit (ODK).
 - https://github.com/PennTURBO/turbo-ontology/releases/tag/2022-05-09







Je ELSEVIER

Journal of Biomedical Informatics:

X Volume 8, December 2020, 100086



A novel tool for standardizing clinical data in a semantically rich model

Hayden G. Freedman ^a, Heather Williams ^a, Mark A. Miller ^a, David Birtwell ^{a, 1}, Danielle L. Mowery ^{a, b}, Christian J. Stoeckert Jr. ^{a, c} 쓰

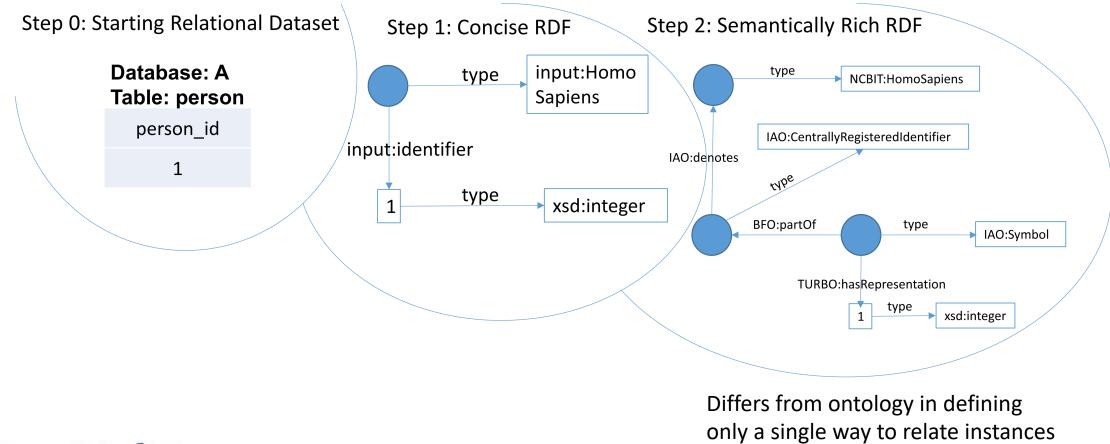
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Received 1 May 2020, Revised 8 September 2020, Accepted 9 September 2020, Available online 19 September 2020.





Explicitly expressing the semantics that are implicit in the data

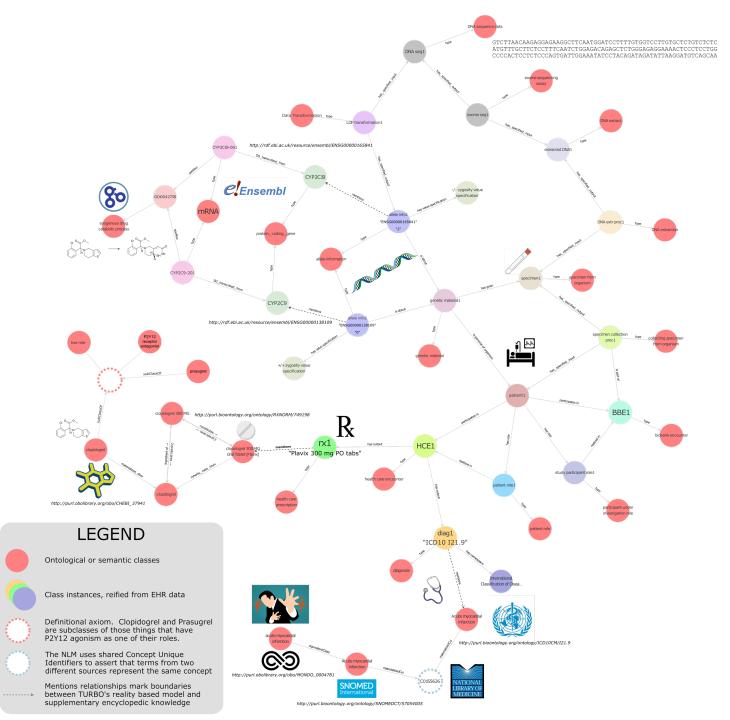


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Visualization of a TURBO graph pattern with mock EHR data: CYP2C19*2/*2 MI patient taking Clopidogrel

Ginical picture and therapeutic options: Patient had a recent myocardial infarction. Gopidogrel was prescribed to inhibit platelet aggregation via $P2Y_{12}$ antagonism. It was later determined that the patient has the CYP2C19* 2/* 2 genotype and lacks the enzyme necessary to convert Gopidogrel into its active form. However, the patient is wildtype for CYP2C9, the gene whose product does the analogous conversion for Prasugrel, another P2Y₁₂ inhibitor.

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	Category of Data	Fields Modeled
Data fields currently included in the PennTURBO Group's clinical data model	Patient demographics and observations	 Centrally Registered Identifier (CRID) Date of Birth Gender Identity Racial Identity Height Weight BMI Systolic Blood Pressure Diastolic Blood Pressure
	Healthcare and Biobank Encounters	Encounter Primary KeyDate of Encounter
	Diagnoses	 Diagnosis Primary Key Diagnosis Code Diagnosis Code Registry (ICD9, ICD10, SNOMED, etc.) Diagnosis Description String
	Medications	 Medication Primary Key Medication Code Medication Code Registry (e.g., RxNorm)
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Can it scale? Comparison of the time taken for the Semantic Engine to transform various types of data, by cohort size.

Cohort Size	Patient	Encounter	Diagnosis	Medication
(Patients)	Instantiation	Instantiation	Instantiation	Expansion Time
	Time (seconds)	Time (seconds)	Time (seconds)	(seconds)
1,000	3	47	6	21
10,000	29	444	62	238
100,000	255	3,004	542	1,757
1,000,000	2,937	37,724	8,734	24,573



Applying ontology-driven tools on real world data: Challenges to applying TURBO

- Using knowledge graphs to connect RWD to ontologies requires significant mapping.
- Need more developers comfortable with graphs, working with triples.
- Operationalizing in a SQL world, matching ontology expressiveness to the needs of the data.
- Recognition of benefit for data integration where individuals matter.



We are developing PennTURBO as generalizable open source projects using GitHub

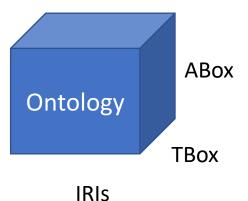
- TURBO team: Heather Williams, Tom Hutchinson, Danielle Mowery, Hayden Freedman (UCI), Mark Miller (LBL), Chris Stoeckert, David Birtwell (USC)
- Carnival: <u>https://github.com/carnival-data/carnival</u>
 - Heather Williams, Tom Hutchinson, David Birtwell, Louis Lee
- Semantic Engine: <u>https://github.com/PennTURBO/semantic-engine</u>
 - Hayden Freedman and the TURBO team
- Knowledge Graphs
 - Tom Huthchinson, Mark Miller and the TURBO team
 - <u>https://github.com/PennTURBO/medication-knowledgegraph-pipeline</u>
 - text strings to RxNorm to drugs and their roles
 - <u>https://github.com/PennTURBO/disease-diagnosis-knowledgegraph-pipeline</u>
 - ICD codes to disease terms
- Currently working on a lab test knowledge graph pipeline.
- <u>https://pennturbo.github.io/Turbo-Documentation/</u>





Insights from a holistic approach in striving for semantic harmony of datasets, communities, and RWD

- Striving to achieve semantic harmony across datasets in VEuPathDB has identified issues to be addressed as a community of ontology developers
 - Patterns for ontology terms
 - Role of application ontologies
- OBI and OBOF are addressing issues of semantic harmony through encouraging community involvement
 - Providing tools (ROBOT, Dashboard), tutorials, and communication platforms but need more outreach.
 - Balancing inclusivity and quality
- Real-world data is about individuals (ABox).
 - Carnival enables the aggregation of data from disparate sources into a unified property graph and provides mechanisms to model and interact with the graph in well-defined ways inspired by OBO Foundry ontologies.
 - TURBO Semantic Engine generates RDF triples with OBOF semantics denoting patients and their health care encounters.



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