

Stanford University Medical Center

### ANALYZING USER INTERACTIONS WITH BIOMEDICAL ONTOLOGIES: A VISUAL PERSPECTIVE

Maulik R. Kamdar (maulikrk@stanford.edu), Simon Walk, Tania Tudorache and Mark A. Musen

### Biomedical Ontologies

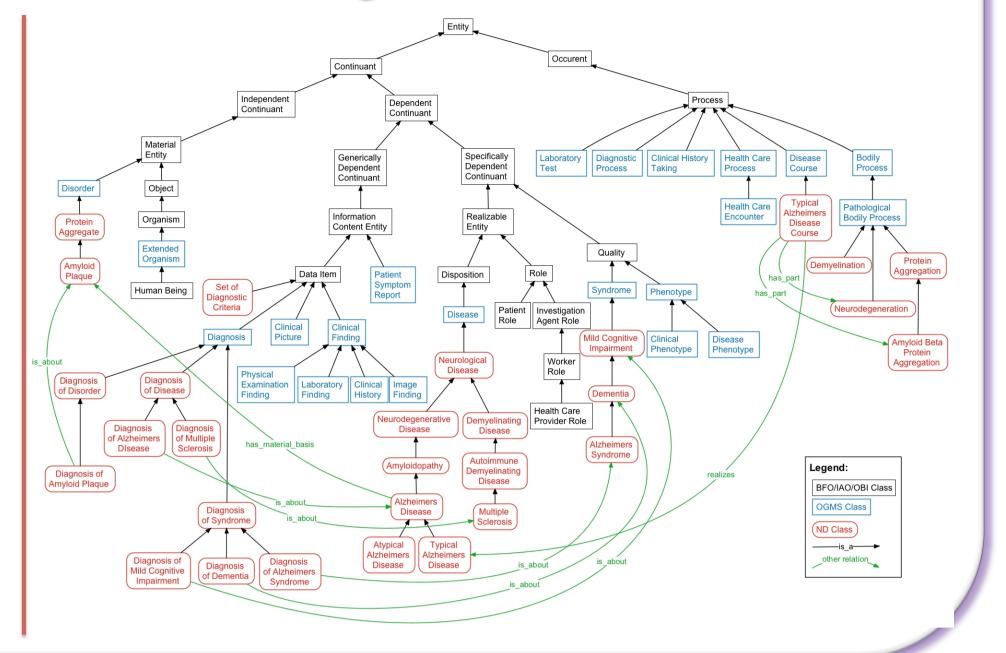




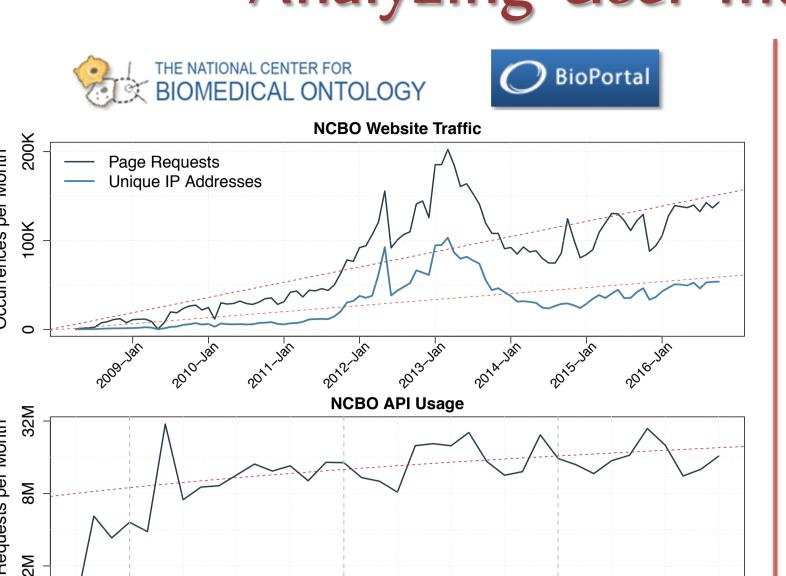




Uses: Knowledge management, semantic search, data annotation, data integration.



### Analyzing User Interactions: Motivation



2013-Oct 2014-126 2014-121 2014-Oct 2015-126 2015-126 2015-121 2015-Oct 2016-126 2016-126 2016-121 2016-Oct

- Ontology Engineers:
  - ♦ Identify exploration and querying patterns
  - ♦ Understand ontology usage and reuse
  - ♦ Prune unwanted classes and relations
  - ♦ Improve ontology content, in general

#### ➤ Biomedical Researchers:

- ♦ Identify temporal research trends
- ♦ Identify frequently accessed classes
- Ontology Repository Maintainers:
- ♦ Categorize user behaviors
- ♦ Develop intelligent interfaces (predict future paths)

ChEBI

♦ Provide targeted recommendations

#### Datasets & Methods

#### Data Characteristics

### January 2015 version

115 Ontologies January 2013 - June 2016

API: 67.2M Requests, 205K Users January 2015 Reuse Data IRI and CUI Reuse

WebUl: 5.4M Requests, 1M Users



Ontology Annotations NHGRI GWAS Catalog PubChem Database of Bio-Assays

#### Attributes

- Maximum Depth (from the root node/s)
- Siblings, Parents, Children, Class Labels
- WebUl Unique IP Requests (annual)

API Unique IP Requests (annual)

- Set of classes browsed or queried by each user
- Number of ontologies reusing a class
- Set of classes reused by an ontology



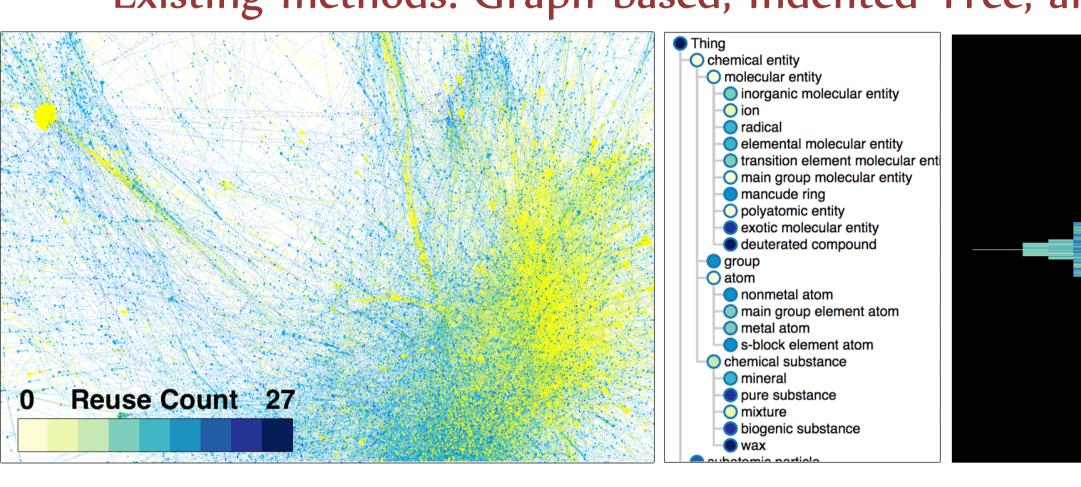
 Number of PubChem assays that use a compound annotated by a ChEBI class

#### Methods embedded in a Web Application:

- Spearman Correlation and <u>Jaccard Similarity</u> for each ontology, for comparisons between WebUI Access, API Access, and Reuse attributes, and significance testing using ANOVA and Tukey HSD post-hoc tests.
- $\bullet$  Fisher's Exact Test with FDR-adjusted p-values and odds ratio to determine significantly accessed classes in an ontology, during a particular time period or using a particular interface.

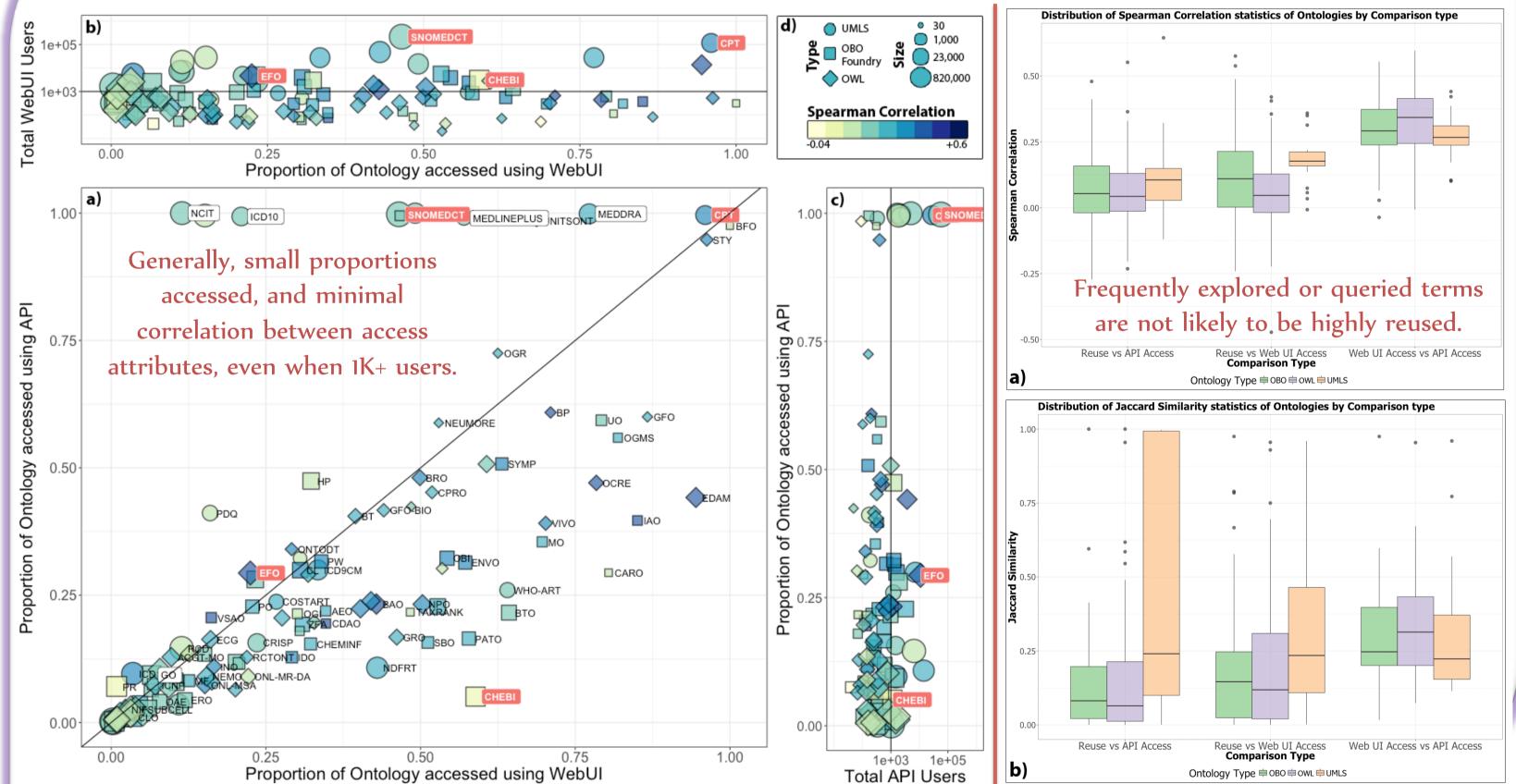
# Visualization of Biomedical Ontologies

Existing methods: Graph-based, Indented Tree, and Implicit Hierarchy

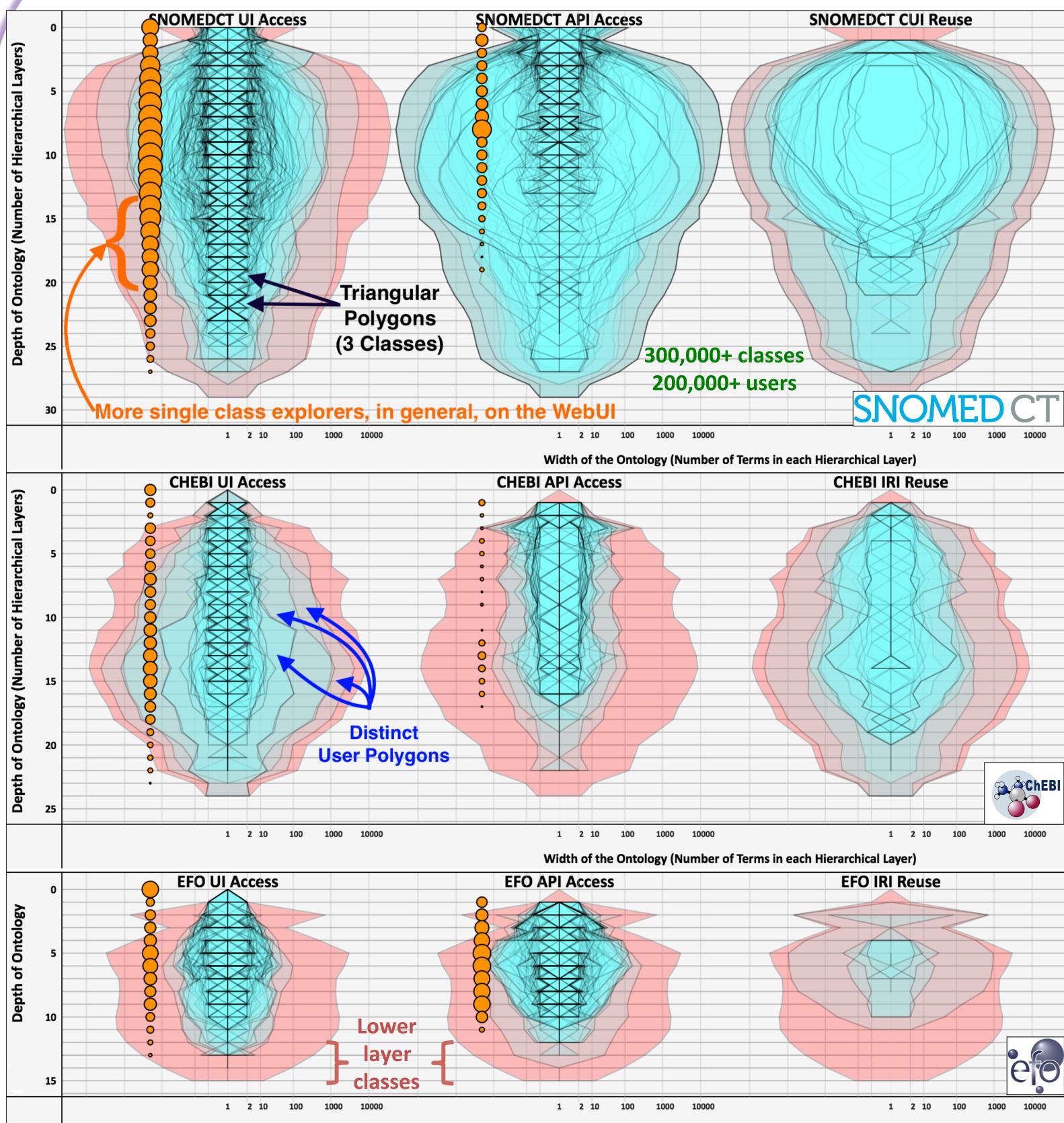


# PolygOnto (Converting the ontological hierarchy to a polygonal shape) Ontology of User-browsed Classes Breadth of an Ontology

## Statistics across Biomedical Ontologies

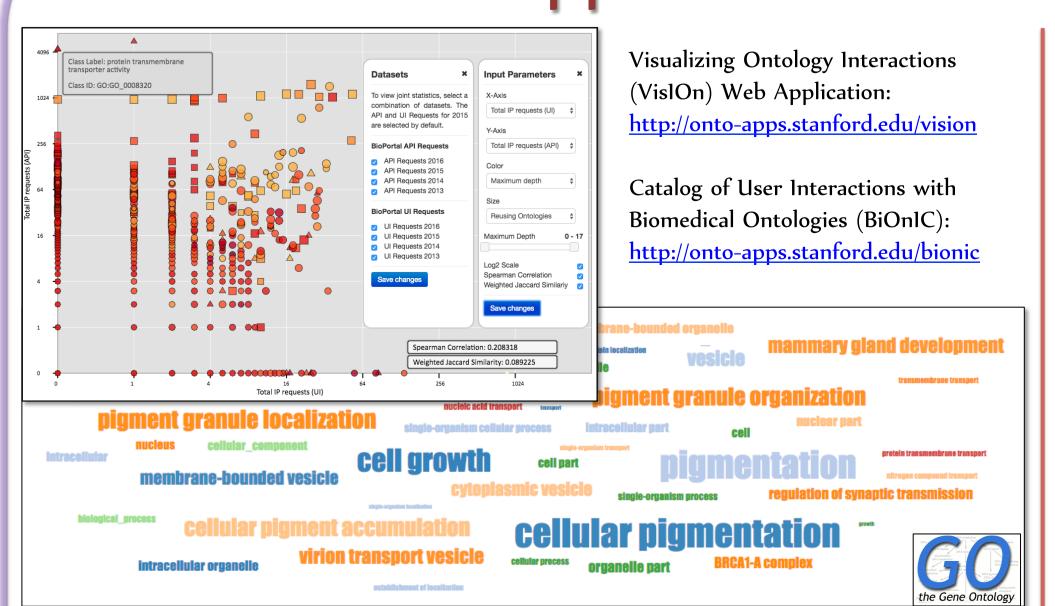


# PolygOnto Visualizations for Access and Reuse



# Web Application & Future Work

Comparing Ontology Usage with Access and Reuse



GWAS

Width of the Ontology

#### Few research directions:

Evaluate usability of PolygOnto and VislOn for different stakeholders.

➤ Usage of EFO in GWAS

and Reuse attributes.

Catalog correlates with Access

➤ Usage of ChEB1 in PubChem

(and other databases) has

Abstract classes in upper

layers are not used.

minimal/negative correlation.

- ➤ Predict next user browsing paths based on user behaviors and ontology structural attributes.
- > Understand influence of time and access mode on why certain classes are browsed or queried more.
- Research to improve ontology users' browsing and querying experience .
- Classes in the lower layers of ontological hierarchy are less explored, queried or reused. > Triangles (1 Parent -> 2 Child classes) and Inverted Triangles (1 Child -> 2 Parents classes) patterns emerge.

Width of the Ontology (Number of Terms in each Hierarchical Layer)

Figure 6. Generally, WebUI user explore more single classes or triangle-shaped patterns (Median = 3).