# KG-Microbe: a reference knowledge-graph and platform for harmonized microbial information

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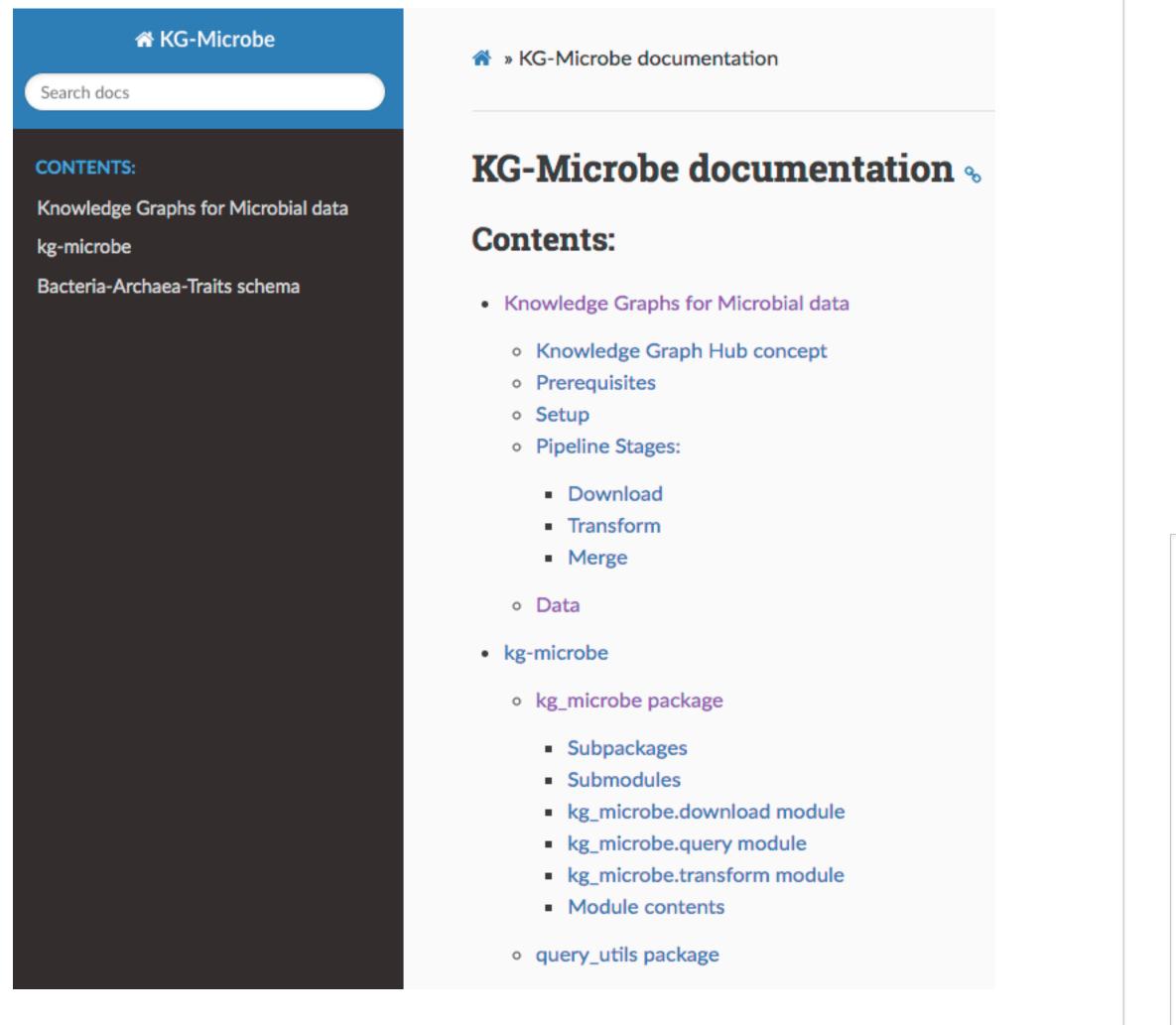
- <sup>3</sup> College of Agricultural Sciences, Oregon State University

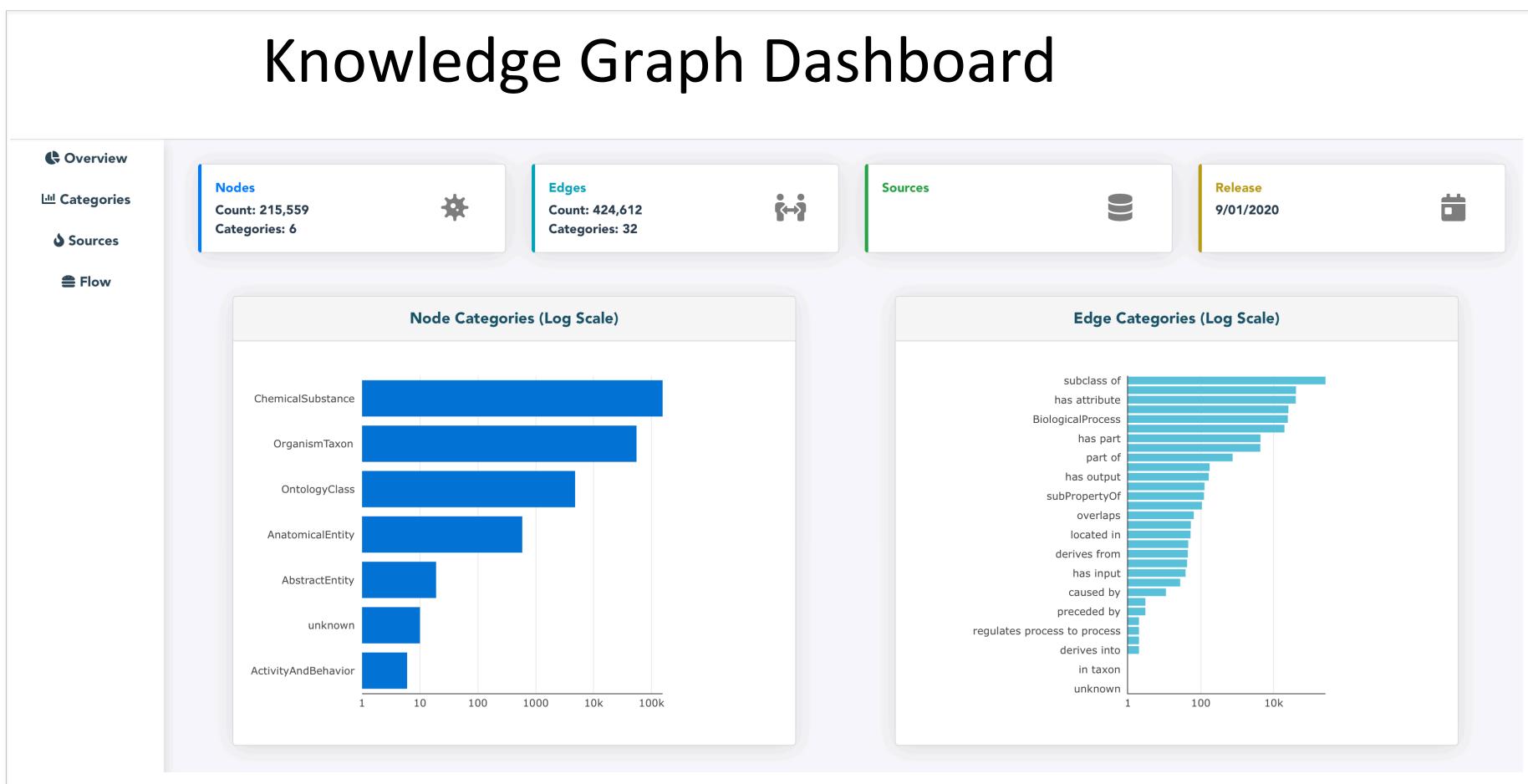
## Knowledge Graph construction template and build pipeline

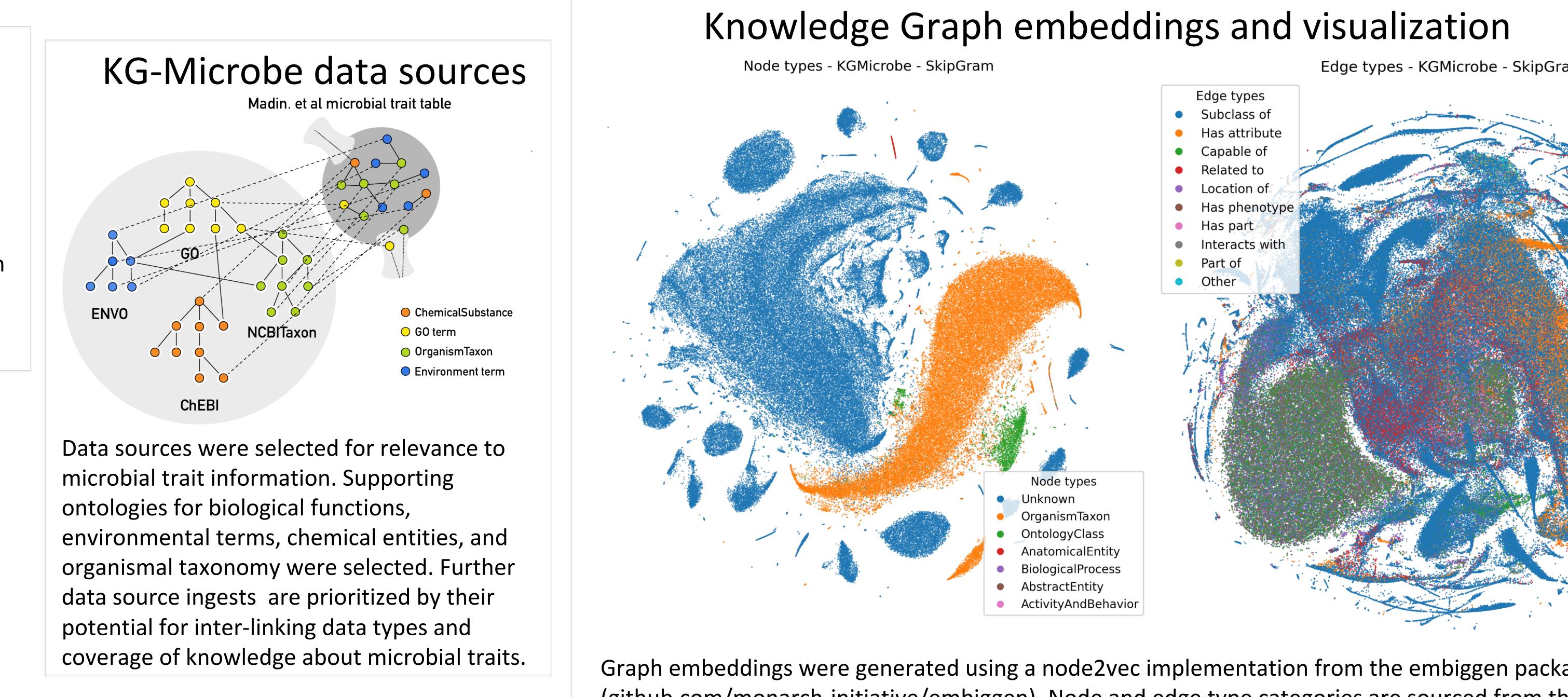
knowledge-graph-hub.github.io/ github.com/Knowledge-Graph-Hub/kg-dtm-template

We used a KG construction pipeline template, covering standard cases for data ingestion, Named Entity Recognition (NER) tool integration for data standardization, tools for interacting with ontologies, as well as KG construction software for merging and summarizing KG data sources.

### Auto-generated documentation knowledge-graph-hub.github.io/kg-microbe







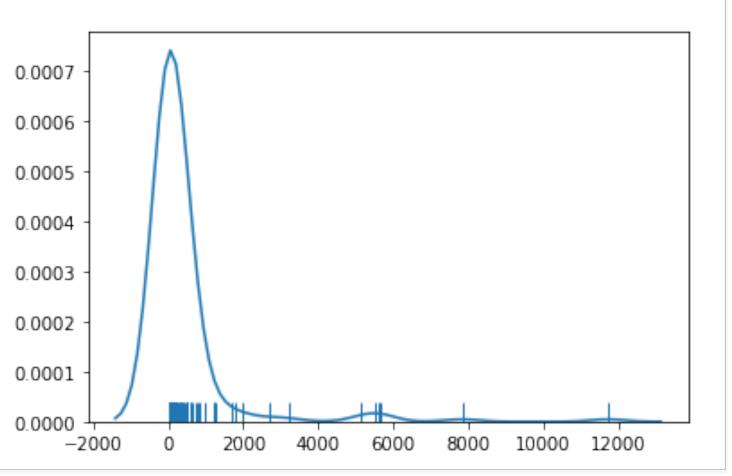
Graph embeddings were generated using a node2vec implementation from the embiggen package (github.com/monarch-initiative/embiggen). Node and edge type categories are sourced from the Biolink Model (biolink.github.io/biolink-model), and used to standardize the KG-Microbe entities and relations.

## Public release directory structure kg-hub.berkeleybop.io/kg-microbe

- GitHub integration with Jenkins: builds and deploys kg monthly.
- Includes raw and transformed individual data sources.
- Merged KG summary statistics.

## Feature frequency

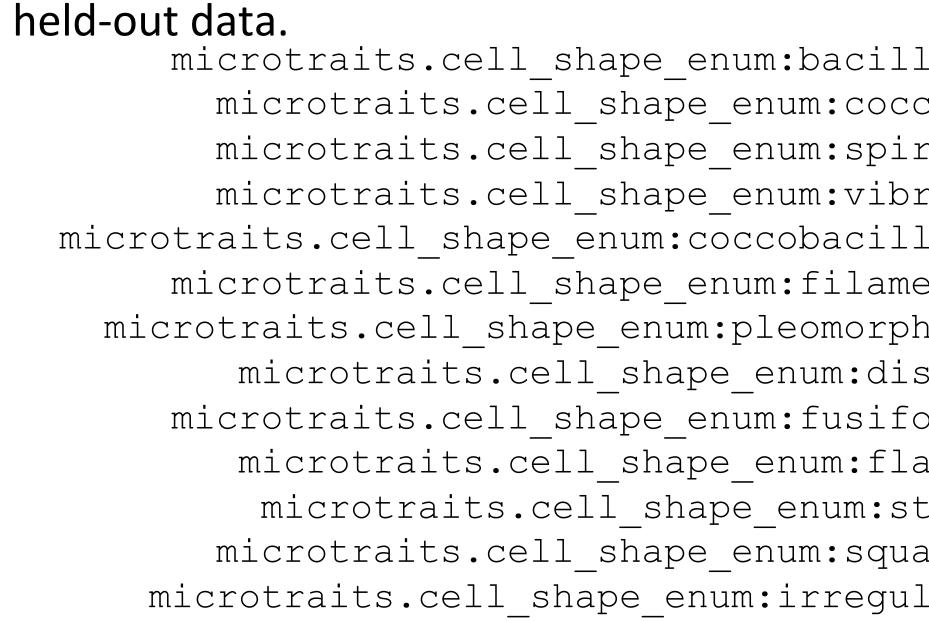
A histogram of feature frequency across the collection of taxa in KG-Microbe. Note that the majority of features are sparse, hence a graph and graph embedding approach is appropriate.



github.com/Knowledge-Graph-Hub/kg-microbe

## Prediction of microbial shape using graph embeddings and gradient-boosted decision trees

Graph embeddings for KG-Microbe nodes were used as input features for a gradient-boosted decision tree classifier (CatBoost). Known taxashape associations were split into test and training, negative associations were generated via random mismatch. Performance was evaluated on 20% with-held data and embeddings generated without the



Edge types - KGMicrobe - SkipGram

microtraits.cell_shape_enum:bacillus microtraits.cell_shape_enum:spiral microtraits.cell_shape_enum:vibrio microtraits.cell_shape_enum:coccobacillus microtraits.cell_shape_enum:filament microtraits.cell_shape_enum:filament microtraits.cell_shape_enum:filament microtraits.cell_shape_enum:filask microtraits.cell_shape_enum:filask microtraits.cell_shape_enum:filask microtraits.cell_shape_enum:star microtraits.cell_shape_enum:irregular	<ul> <li>microtraits cell shape_enum-bacillus - microtraits cell shape_enum-bacillus - microtraits cell shape_enum-cooccus</li> <li>microtraits cell shape_enum-ribrio</li> <li>microtraits cell shape_enum-ribrio</li> <li>microtraits cell shape_enum-ribrio</li> <li>microtraits cell shape_enum-flament</li> <li>microtraits cell shape_enum-flament</li> <li>microtraits cell shape_enum-flask</li> </ul>	microtraits.cell_shape_enum:filament microtraits.cell_shape_enum:bacillus microtraits.cell_shape_enum:coccus microtraits.cell_shape_enum:disc microtraits.cell_shape_enum:fusiform microtraits.cell_shape_enum:spiral microtraits.cell_shape_enum:vibrio microtraits.cell_shape_enum:flask microtraits.cell_shape_enum:flask microtraits.cell_shape_enum:square microtraits.cell_shape_enum:coccobacillus microtraits.cell_shape_enum:pleomorphic microtraits.cell_shape_enum:branced microtraits.cell_shape_enum:branced
xx	201	x99
xx	201	x9
xx	201	x01
xx	201	x03
		x03

	precision	recall	f1-score	support
lus	0.99	0.98	0.98	2343
cus	0.93	0.94	0.94	103
ral	0.95	0.98	0.97	1123
rio	1.00	0.75	0.86	4
lus	0.99	0.98	0.98	96
lent	1.00	1.00	1.00	1
hic	1.00	1.00	1.00	3
SC	1.00	0.50	0.67	2
orm	1.00	1.00	1.00	11
ask	1.00	0.97	0.99	157
tar	1.00	0.50	0.67	2
are	1.00	1.00	1.00	1
lar	1.00	0.99	1.00	102
			0.98	3948