

Inducing Discourse Marker Inventories from Lexical Knowledge Graphs

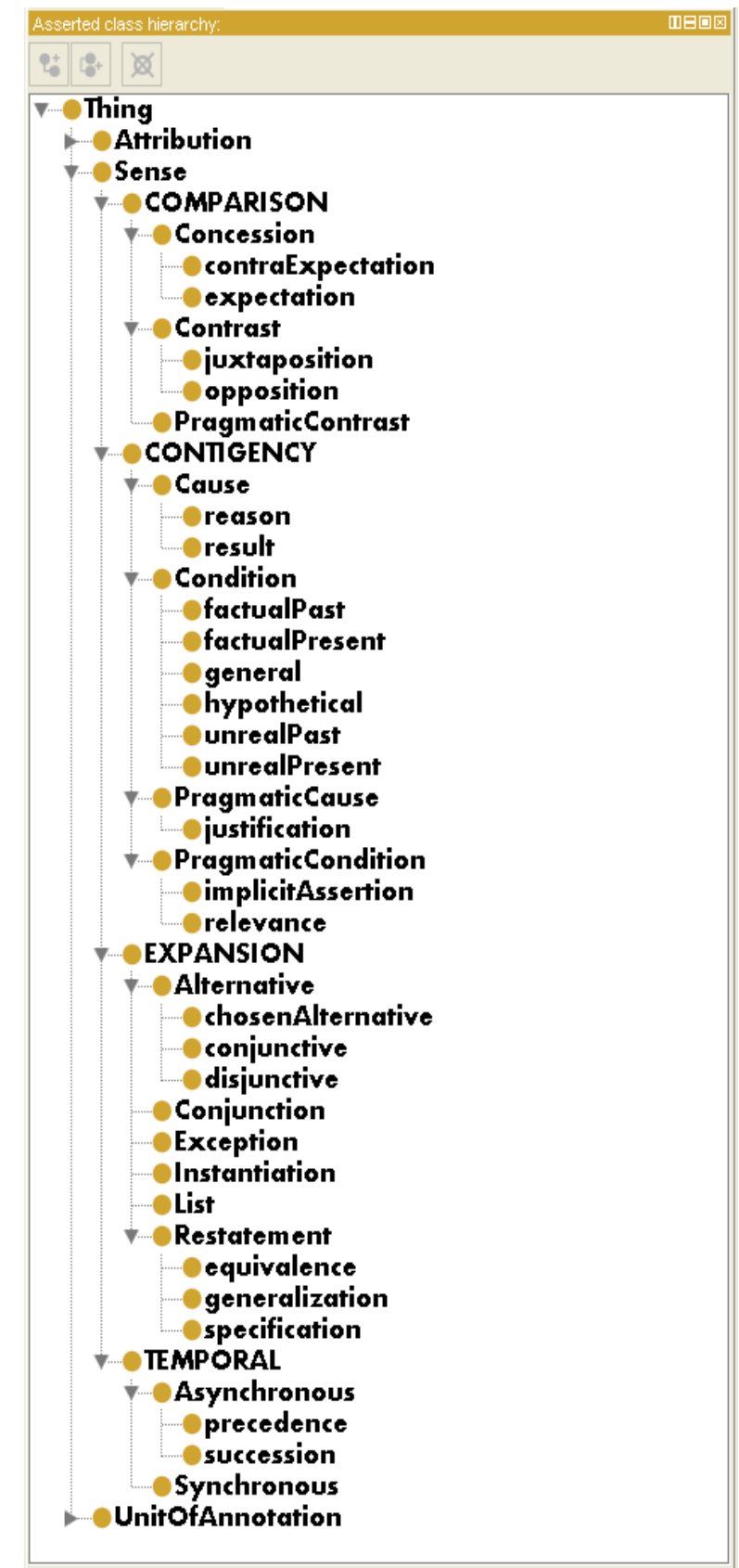
Prêt-à-LLOD

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Discourse marker inventories: Discourse markers => discourse relations (e.g., for Penn Discourse Treebank)

| # | FORM | level 0 | level 1 | level 2 | level 3 |
|----------------|------|-------------|-----------------------|--------------------------|---------|
| "weil"@de | True | CONTINGENCY | CONTINGENCY:Cause | CONTINGENCY:Cause:Reason | |
| "weiterhin"@de | True | EXPANSION | EXPANSION:Conjunction | EXPANSION:Conjunction | |



Lexical induction: Given discourse marker inventories in multiple source languages
 Translate discourse markers into target languages, keep (propagate) relations
 Aggregate over multiple sources => confidence scores [=> filters]
 Iterate with indirect translations

Pre-requisites: Discourse marker inventories in machine-readable (interoperable) formats
 Normalization of discourse relations against a uniform relation taxonomy
 Large collection of dictionaries in machine-readable (interoperable) formats

Machine-readable discourse marker inventories

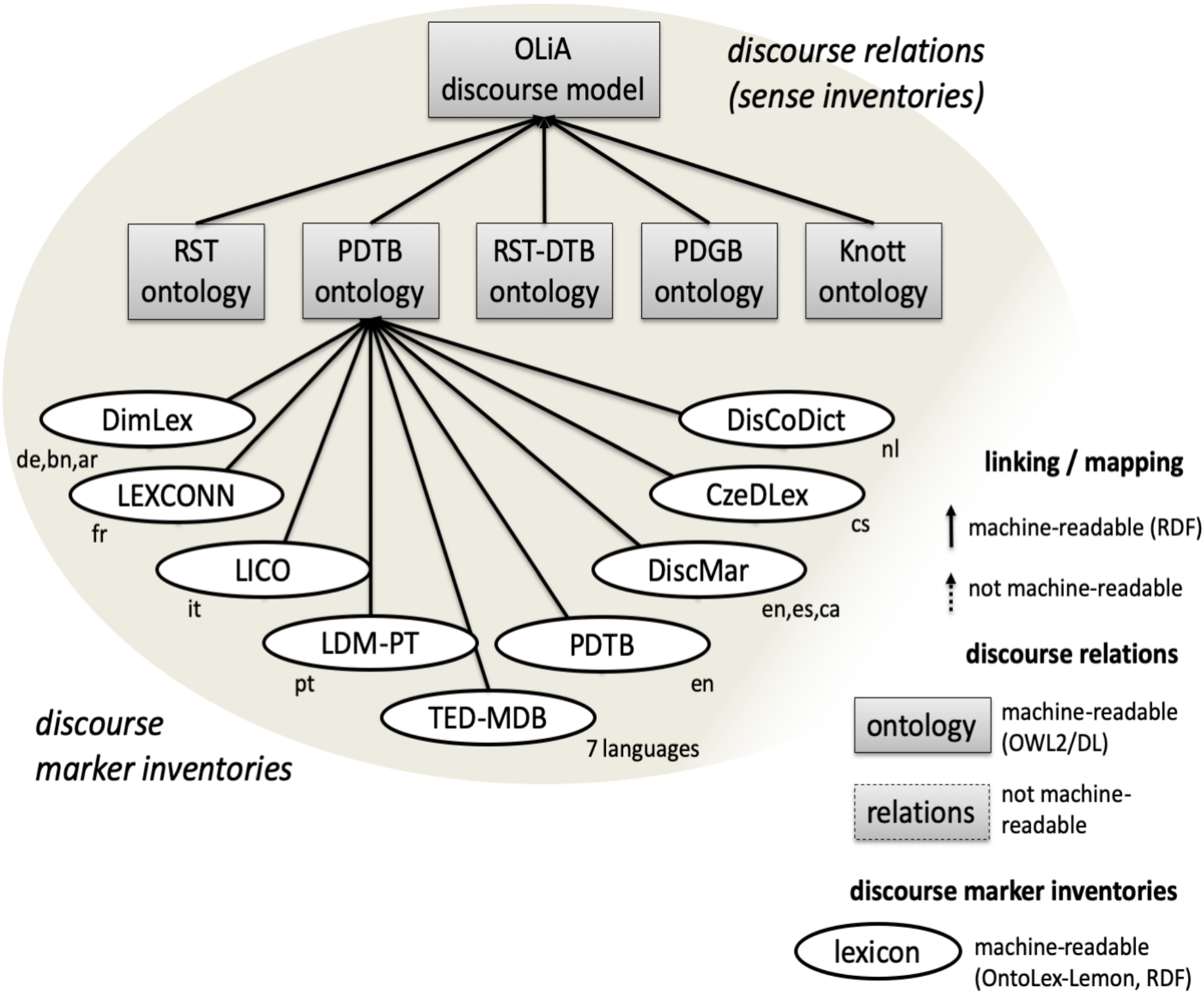
<http://github.com/acoli-repo/rdf4discourse/discourse-markers>

- 16 languages, 19 inventories (Chiarcos & Ionov 2021)
 - Partially building on TextLink/Connective-lex.org
 - **Data model:** OntoLex
 - **Formats:** RDF (=> TSV, with SPARQL)
 - **Discourse relation taxonomies:** PDTB, RST, CCR
- multiple taxonomies linked with an overarching ontology
 => "translate" between frameworks, using the shortest path

Machine-readable dictionaries

<http://github.com/acoli-repo/acoli-dicts>

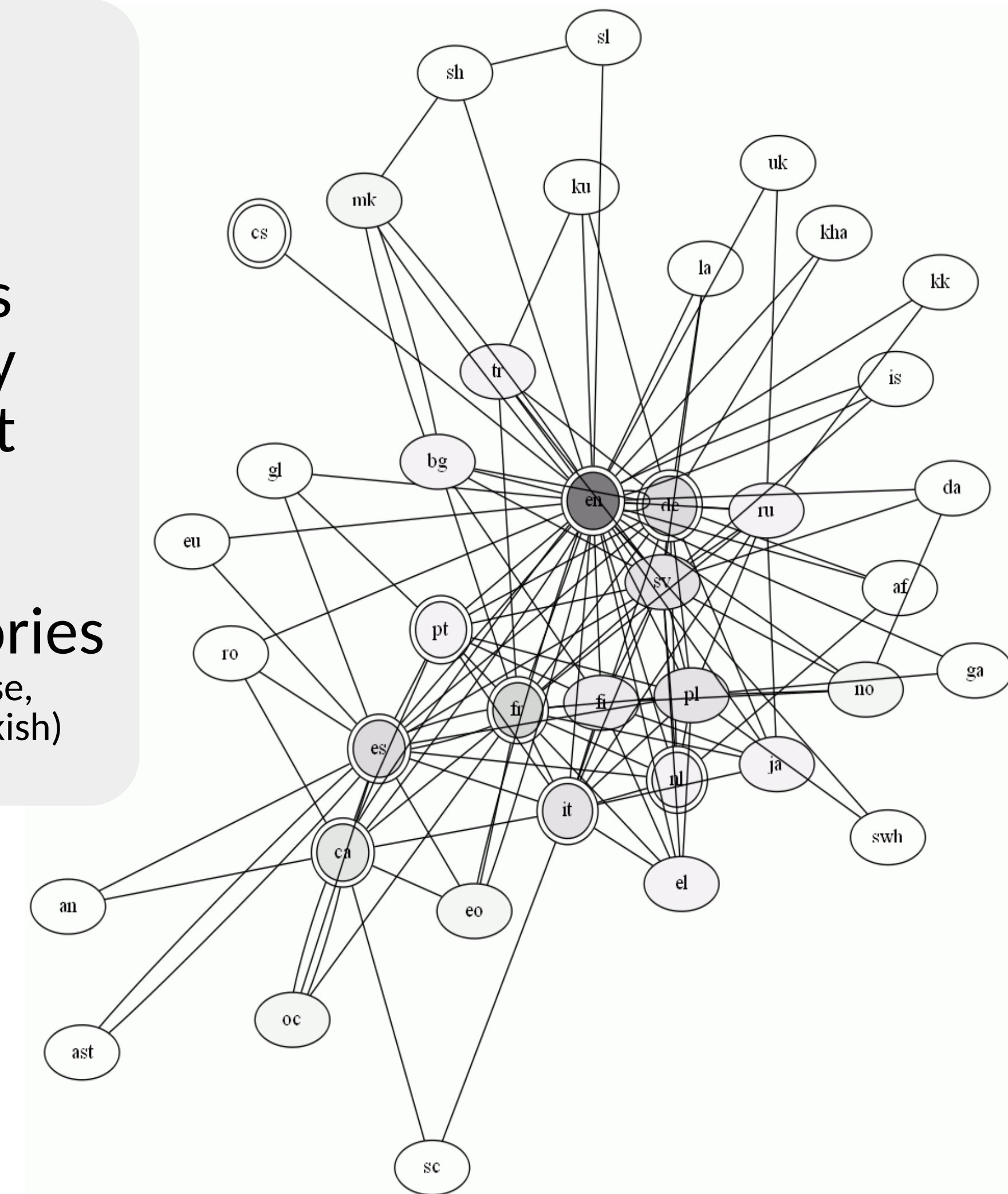
- 430+ languages, 3000+ bi-dictionaries (Chiarcos et al. 2020)
- RDF layer over PanLex, Apertium, FreeDict, MUSE, etc.
- **Data model:** OntoLex
- **Formats:** RDF (=> TSV, with SPARQL)
- **Selected subsets**
 - **Apertium** 53 dictionaries for MT, mostly Romance
 - **FreeDict** 145 dictionaries, heterogeneous
 - **MUSE** 108 dictionaries, machine-generated



Experimental Setup

<http://github.com/acoli-repo/rdf4discourse/lexical-induction>

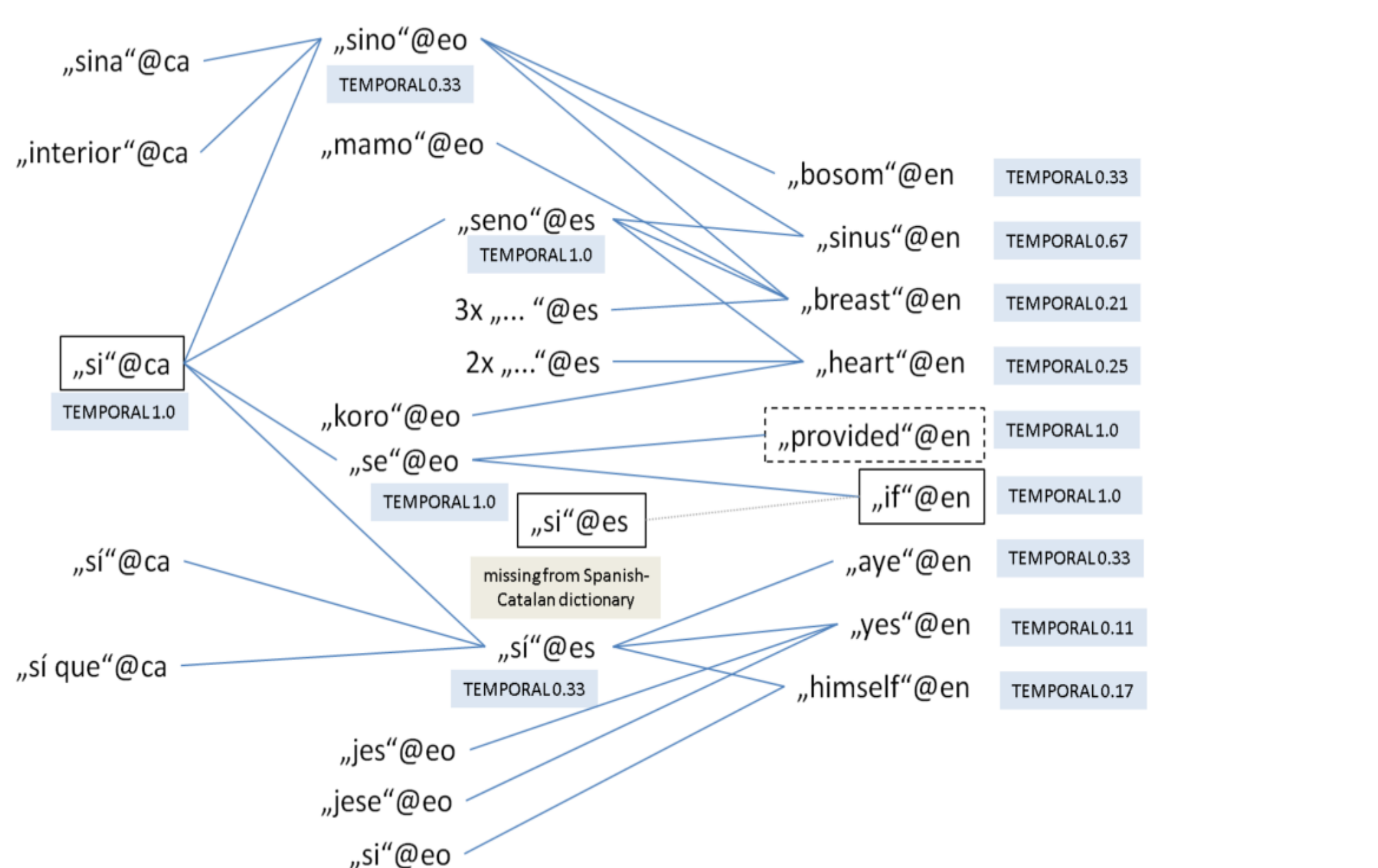
- 11 inventories, 9 languages
- PDTB, each level separately
- evaluate prec, rec, f against target inventories
- **Publish 10 induced inventories** (Bulgarian, Greek, Esperanto, Finnish, Japanese, Norwegian, Polish, Russian, Swedish and Turkish)



- lang language
- ◐ language with discourse marker inventory
- >= 1 dictionary

Constrained Induction

- Operate over confidence scores for discourse relations
- Initialize word w with $1/(\text{number of senses})$
- Propagate relation score to word v : average over relation scores for translations (w. score)
- **Constraints:** (optionally) filter by
 - min result score
 - min pivots (translations)
 - min pivot languages (of translations)
 - max senses (top k relations, only)



Results (also see paper)

- Direct induction (e.g., from/to English) yields best results, but depends on dictionary quality
- Apertium: "gold standard", but only 2 inventory languages with links to English
- FreeDict/MUSE: insufficient coverage
- **Constrained indirect induction is a feasible fallback-strategy**

| dicts | level | min score | min pivot languages | max senses | prediction | p | r | f |
|---|-------|-----------|---------------------|--------------|------------|-------|-------|-------|
| best-performing direct induction (over aggregated/all dictionaries, cs,de,fr,it,nl,pt) | | | | | | | | |
| all-pt-en | 2 | 0.50 | 6 | unrestricted | 535 | 0.164 | 0.815 | 0.274 |
| all-pt-en | 3 | 0.75 | 6 | unrestricted | 707 | 0.127 | 0.804 | 0.220 |
| average scores for direct induction (cs,de,fr,it,nl,pt) | | | | | | | | |
| all | 2 | | | | 604 | 0.154 | 0.682 | 0.242 |
| all | 3 | | | | 645 | 0.106 | 0.403 | 0.164 |
| best-performing pivot language restriction | | | | | | | | |
| all | 2 | 0.50 | 6 | unrestricted | 441 | 0.222 | 0.632 | 0.329 |
| all | 3 | 0.75 | 6 | unrestricted | 251 | 0.247 | 0.369 | 0.296 |
| best-performing restriction on projected senses | | | | | | | | |
| all | 2 | 0.45 | 5 | 4 | 250 | 0.364 | 0.669 | 0.472 |
| all | 3 | 0.45 | 5 | 4 | 256 | 0.309 | 0.622 | 0.413 |

- Precision is dissatisfying, but recall is reasonable => Baseline
 => Generated inventories can be a basis for **manual pruning**
 (note that discourse marker inventories are generally small, < 1000 entries)