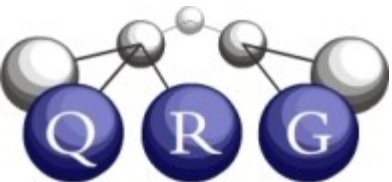


Combining Analogy with Language Models for Knowledge Extraction

Danilo N. Ribeiro

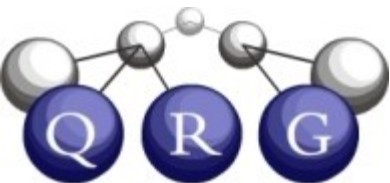
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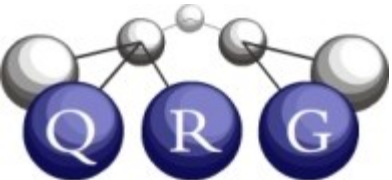
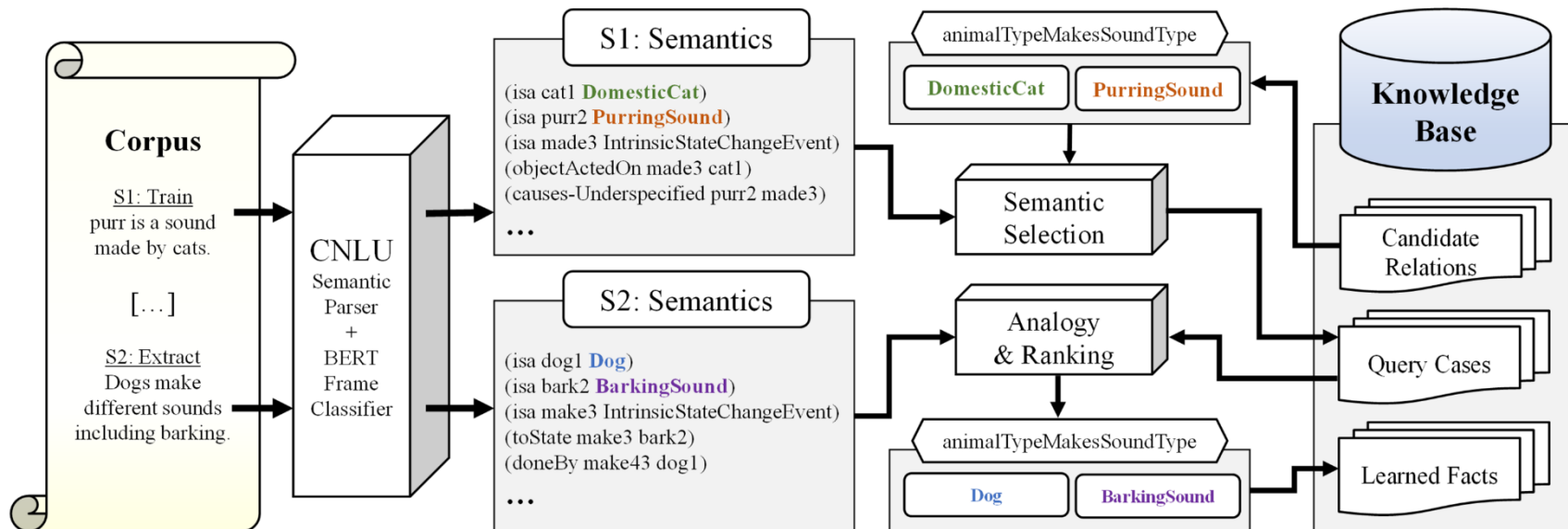
Problem

- Knowledge base (KB) completion
 - Learn from text to populate existing KB with new facts
 - Target common nouns (e.g., “dog” or “oxygen”), instead of named entities (e.g., “Joe Biden” or “Brazil”)
- Challenges:
 - Schema and concepts defined by existing KB
 - not open domain
 - CycL representation
 - not simple triples
 - Few examples per relation
 - low resource learning



System Overview

- Combining Analogy and Language Models
 - Analogical Training
 - Able to learn from few training examples
 - Fact Scoring
 - Uses BERT to classify correctness of generated facts



Data and Results

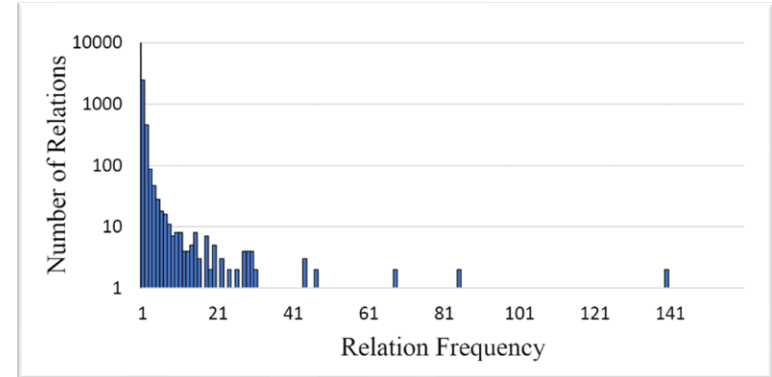
- Knowledge base (KB) completion

- Knowledge Base: NextKB

- 66,649 facts with
- 3,745 distinct relations
- Long tail distribution

- Text Corpus: SE Wikipedia

- 2,679 articles



- Baselines

- Relation Extraction (CNN & BERT encoders)

- Text-to-Text (T5-base)

Method	Estimated Precision
Relation Extraction (CNN) *	17,1%
Relation Extraction (BERT) *	20,8%
Text-to-Text (T5)	26.0%
Analogy (AKE)	45.7%
Analogy (AKE) + BERT fact classifier	71.4%

