

Neuro-symbolic Consolidation of Crowdsourced Knowledge: The ORKG Use Case

Sandra Schaftner, Martin Gaedke

<https://vsr.informatik.tu-chemnitz.de/research/>

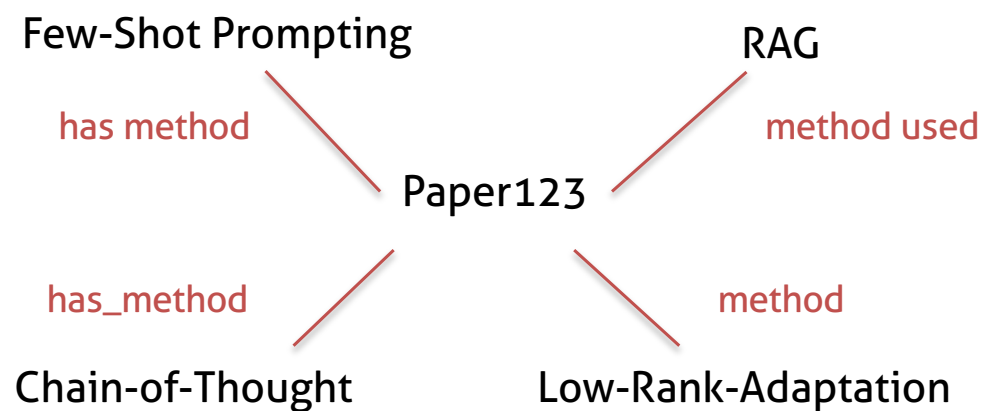


Semantically FAIR Data

~~Knowledge Graphs make data FAIR~~

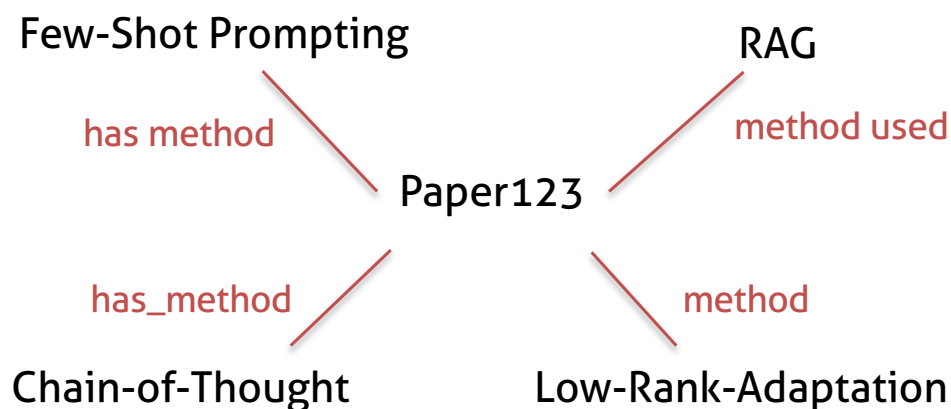
Semantically FAIR Data

~~Knowledge Graphs make data FAIR~~

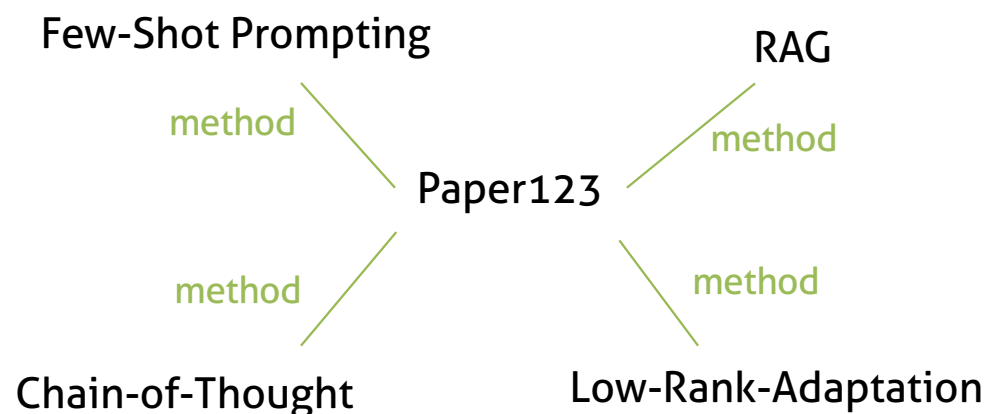


Semantically FAIR Data

~~Knowledge Graphs make data FAIR~~



Shared semantics make data FAIR



FAIRness Gap

2



Deep Semantic Scientific Knowledge Graphs

Publication metadata

+

Content-based information

Authors
Venue
Publication date
Citations

Information

Methods
Datasets
Benchmarks
Metrics

Deep Semantic Scientific Knowledge Graphs

Publication metadata

+

Content-based information

Dcterms
FaBiO
CiTO
Schema.org
Wikidata

Ontologies/
Vocabularies

?

ORKG Properties Ontology

Crowdsourcing approach



> 13,000 properties

+

- + Rich source of knowledge
- + Wide adoption and integration

-

- Semantic inconsistencies
- Duplicates

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Crowdsourcing approach



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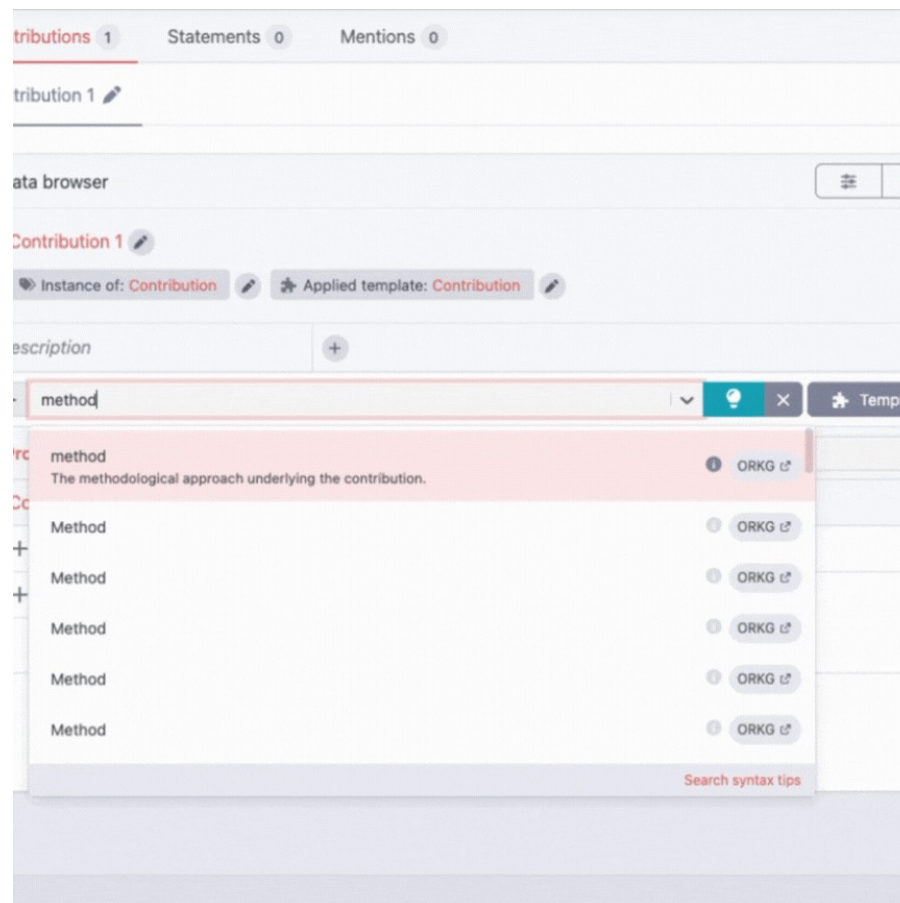
- Semantic inconsistencies
- Duplicates



Neuro-symbolic consolidation

ORKG Properties Ontology

Limitations:
User Experience &
Machine Actionability



<https://orkg.org/papers/create>

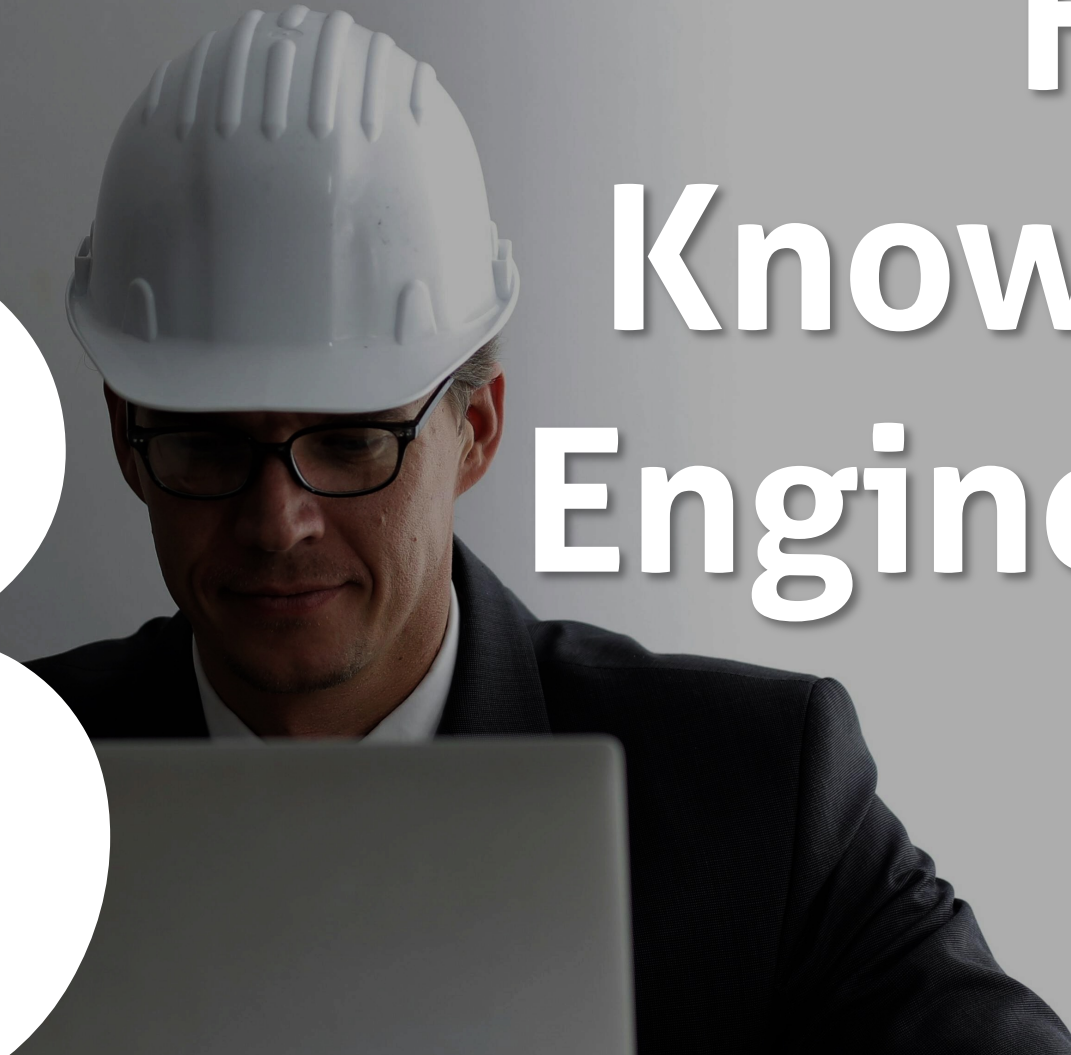
ORKG Properties Ontology

Limitations:
Structured
comparisons

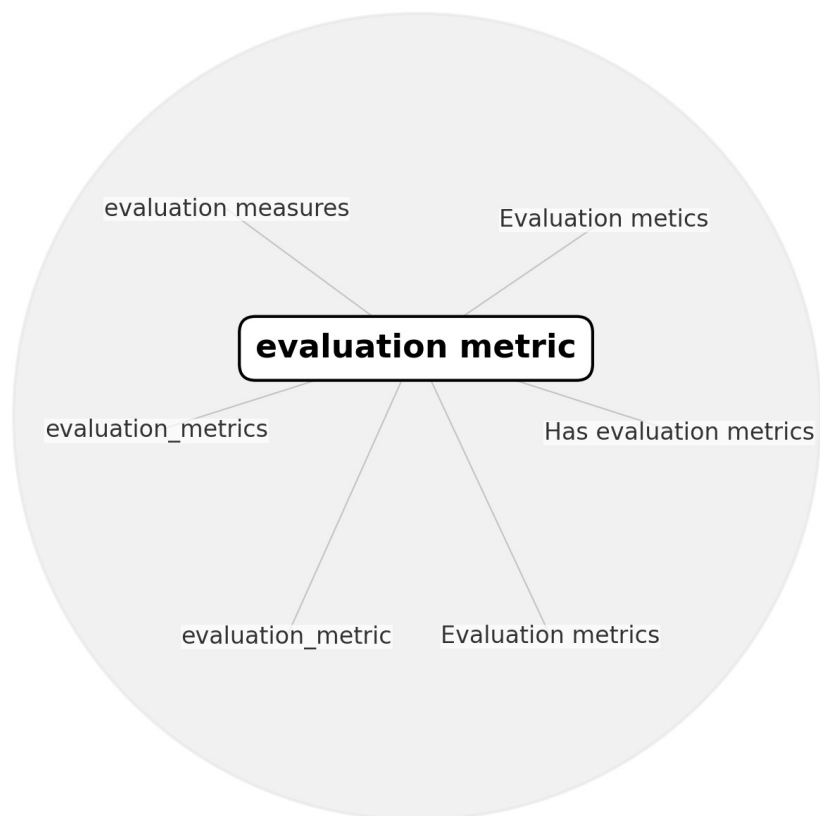
 View Tools About ORKG Ask  Search... + Add new 					
Properties	LLM Augmented LLMs: Expanding Capabilities through Composition Contribution 1	More Agents Is All You Need Contribution 1	CAMEL: Communicative Agents for "Mind" Exploration of Large Language Model Society Contribution 1	AutoGen: Enabling Next-Gen LLM Applications via Multi-Agent Conversation Contribution 1	AgentVerse: Facilitating Multi-Agent Collaboration and Exploring Emergent Behaviors Contribution 1
			n. Additionally, human and LL Show more		
Disadvantage	Requires weight access and backpropagation through anchor model			Potential conversation loops	High computational cost due to multiple interacting agents
Evaluation metric	3-shot	Accuracy	Accuracy	Accuracy	HumanEval
Evaluation metric	Blue		GPT-4	Bleu	Pass@1
Evaluation metric	F1 scores		HumanEval		
Evaluation metric	Pass@1		HumanEval+		
Evaluation metric	Zero-shot		Pass@k		
Involved methods	Cross Attention Layer	Multi-agent collaboration	Critic-In-The-Loop	Human in the loop	Multi-agent collaboration
Involved methods	LoRA	Subsequent voting	Fine tuning	One Agent To Rule Them All: Towards Multi-agent Conversational AI	
Involved methods			Multi-agent collaboration		
Involved methods			Prompt Engineering		
Findings	CALM achieves 84.3% accuracy on KV-Arithmetic	Debate-style coordination yields higher math and reasoning accuracy	CAMEL agent solutions outperform gpt-3.5-turbo single-shot in both human and GPT-4 evaluation	Agent collaboration improves code generation and debugging performance	Multi-agent collaboration improves problem solving compared to single-agent systems

<https://orkg.org/comparisons/R1587807>

Hybrid Knowledge Engineering



Method

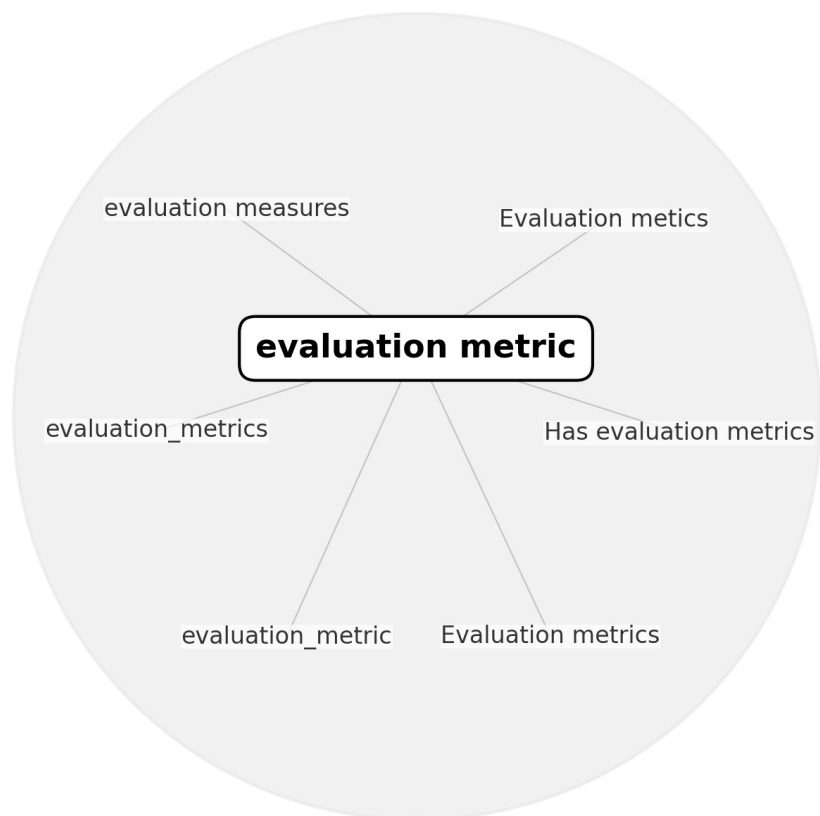


Clustering via **embedding model**

+

Cluster splitting and property selection via **LLM**

Method



Challenges

Clustering:
No universal "best"
threshold size

Splitting:
Adequate few-shot
examples for the LLM

Method

Few-shot examples for LLM cluster splitting decisions:

```
Cluster: ["Conclusion", "Summary", "has conclusion", "is conclusive"]
Decision: {"decision": "KEEP"} <-- Synonyms

Cluster: ["published by", "published in", "has published"]
Decision: {"decision": "BREAK"} <-- Distinct semantic roles (Agent vs. Venue)

Cluster: ["evaluation method", "evaluation metric", "evaluation results"]
Decision: {"decision": "BREAK"} <-- Distinct research phases

Cluster: ["ontology based", "Ontology ID", "Ontology URL"]
Decision: {"decision": "BREAK"} <-- Attribute vs. Identifier vs. Locator
```

Challenges

Clustering:
No universal "best"
threshold size

Splitting:
Adequate few-shot
examples for the LLM

Significant Consolidation



Evaluation

Total count of properties:

ORKG Properties:

13,009 properties

OPO-Consolidated:

2865 properties



Evaluation

Ambiguity measurement:

ORKG Properties:

47 results

OPO-Consolidated:

8 results



Evaluation method: Average number of candidate properties returned for a specific property from the ORKG Gold Standard Dataset³

³ Vladyslav Nechakhin et al. 2024. ORKG Properties and LLM-Generated Research Dimensions Evaluation Dataset. doi:10.25835/6OYN9D1N

Evaluation

Backward compatibility:

100 %

```
orkg:P175087 a rdf:Property ;  
  rdfs:label "research_method" ;  
  owl:equivalentProperty orkg:P15068 ;  
  skos:exactMatch orkg:P15068 .  
  
orkg:P15068 a rdf:Property ;  
  rdfs:label "research method"@en ;  
  dcterms:created "2020-03-30T20:57:44.811000+02:00"^^xsd:dateTime ;  
  dcterms:identifier "P15068" ;  
  rdfs:comment ""@en ;  
  rdfs:isDefinedBy <https://w3id.org/orkg-properties-ontology-consolidated> ;  
  skos:prefLabel "research method"@en .
```

<https://w3id.org/orkg-properties-ontology-consolidated>

Code, Paper & Ontology



<https://sandraschaftner.github.io>

Discussion & Future Work

Further crowdsourced ontologies to be consolidated?

Ideas for improving the consolidation approach?

Contact & Acknowledgment



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