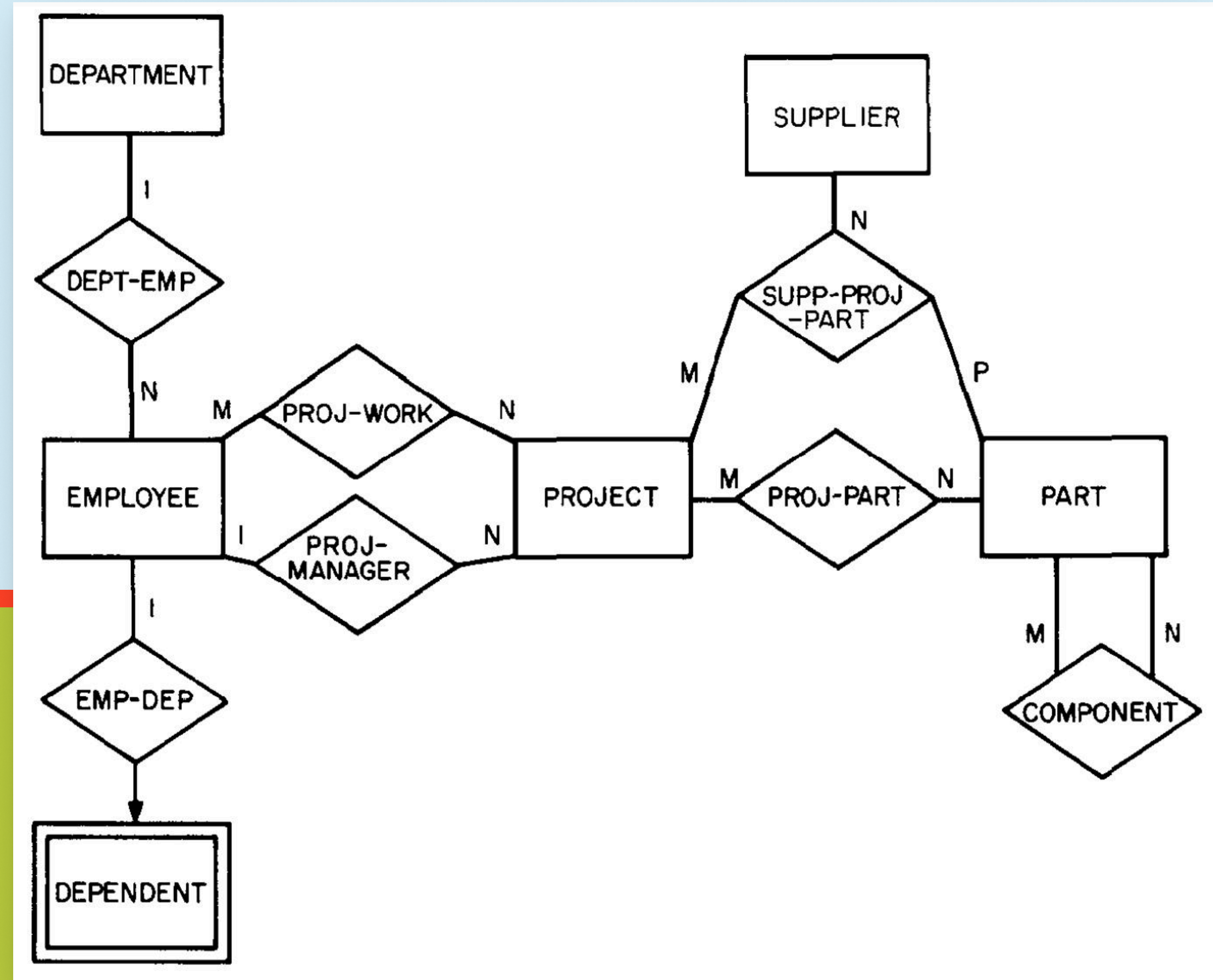
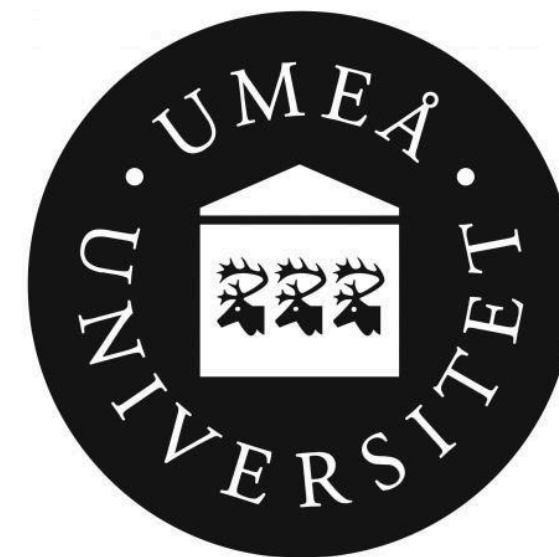


# Conceptual modeling, explanation, abstraction, and all that

Elena Romanenko



Prof Diego Calvanese  
Prof Giancarlo Guizzardi  
Prof Oliver Kutz



**UNIVERSITY  
OF TWENTE.**

Based on collaborative work and joint publications



# AGENDA

01

State-of-the-art in conceptual modeling

02

If you understand it, you can use it!

03

Abstraction as part of the explanation process

04

ExpO prototype

05

Future directions

# DISCLAIMER

Ontology, Foundational Ontology

“an explicit specification of a conceptualization” (Gruber)

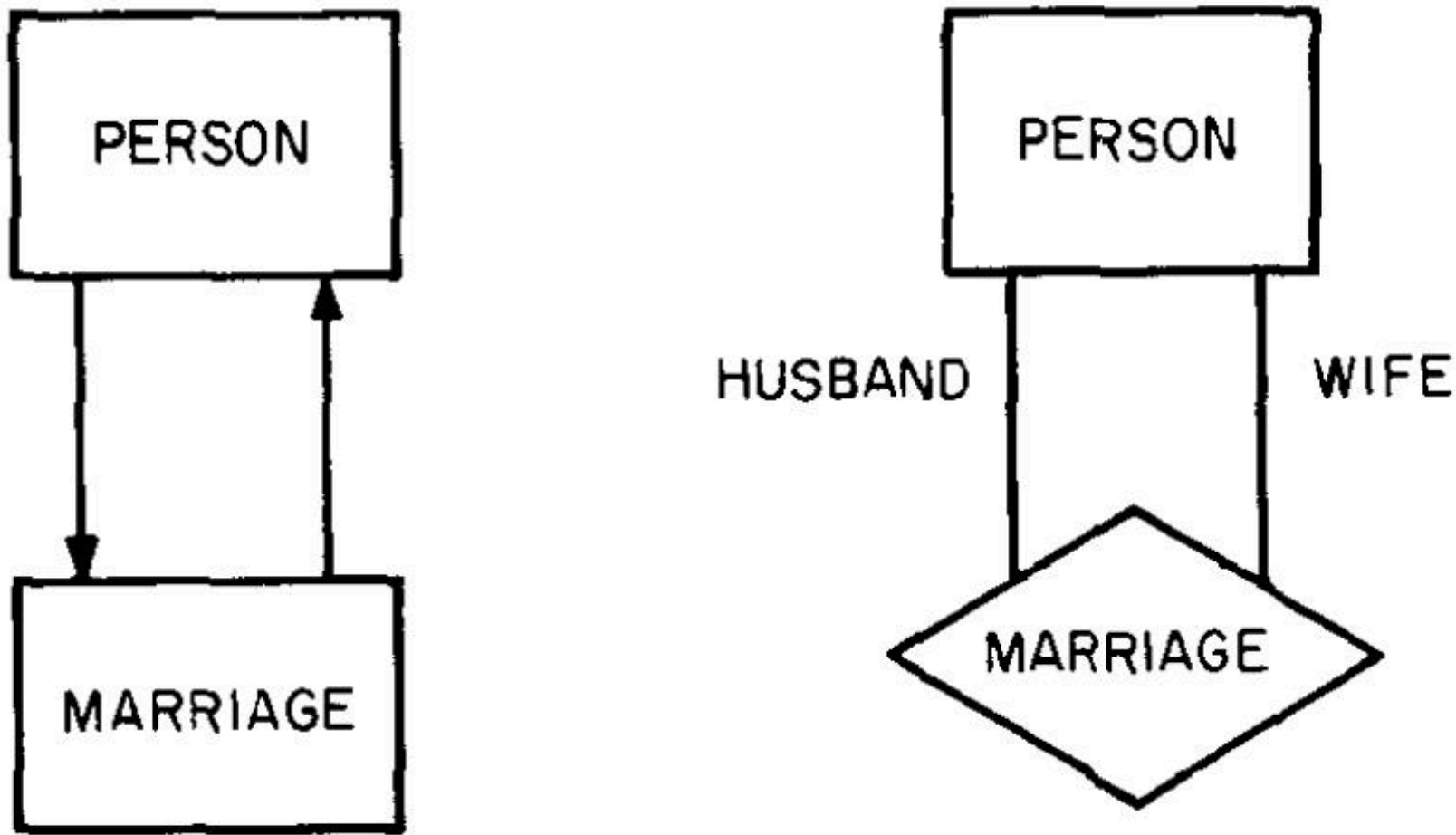
Conceptual model, Domain Ontology

Ontology-Driven Conceptual Model

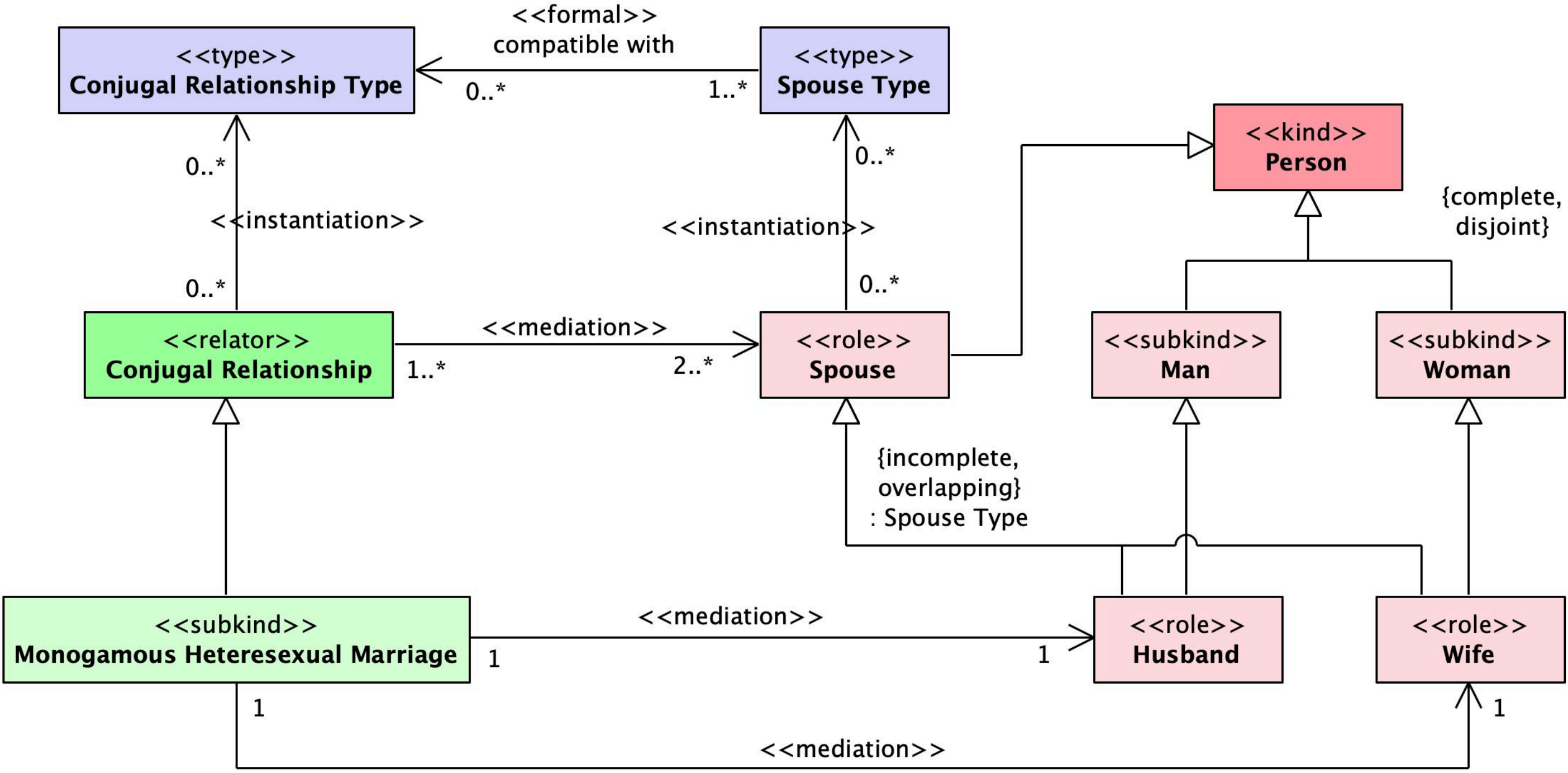
“the configuration of conceptual elements and the navigation between them” (Parush)

“any model that is formed after a conceptualization or generalization process” (Wiki)

“a high-level, abstract representation that helps people understand and communicate the essential aspects of a system, idea, or domain” (ChatGPT)



ER MODEL (1976)



ONTOUML MODEL (2022)



SURVEY

# Conceptual Modeling: Topics, Themes, and Technology Trends

Authors:  [Veda C. Storey](#),  [Roman Lukyanenko](#),  [Arturo Castellanos](#) | [Authors Info & Claims](#)

[ACM Computing Surveys](#), Volume 55, Issue 14s • Article No.: 317, Pages 1 - 38 • <https://doi.org/10.1145/3589338>

Published: 17 July 2023 [Publication History](#)



 8  1,274

Data & Knowledge Engineering 154 (2024) 102351

Contents lists available at [ScienceDirect](#)



ELSEVIER

Data & Knowledge Engineering

journal homepage: [www.elsevier.com/locate/datak](http://www.elsevier.com/locate/datak)

Systematic  
literature review  
AND  
bibliometric analysis

Unraveling the foundations and the evolution of conceptual modeling—Intellectual structure, current themes, and trajectories

Jacky Akoka<sup>a</sup>, Isabelle Comyn-Wattiau<sup>b</sup>, Nicolas Prat<sup>b</sup>, Veda C. Storey<sup>c,\*</sup>

<sup>a</sup> CEDRIC-CNAM, Paris, France

<sup>b</sup> ESSEC Business School, Cergy-Pontoise, France

<sup>c</sup> Computer Information Systems, J. Mack Robinson College of Business, Georgia State University, Atlanta, GA, United States



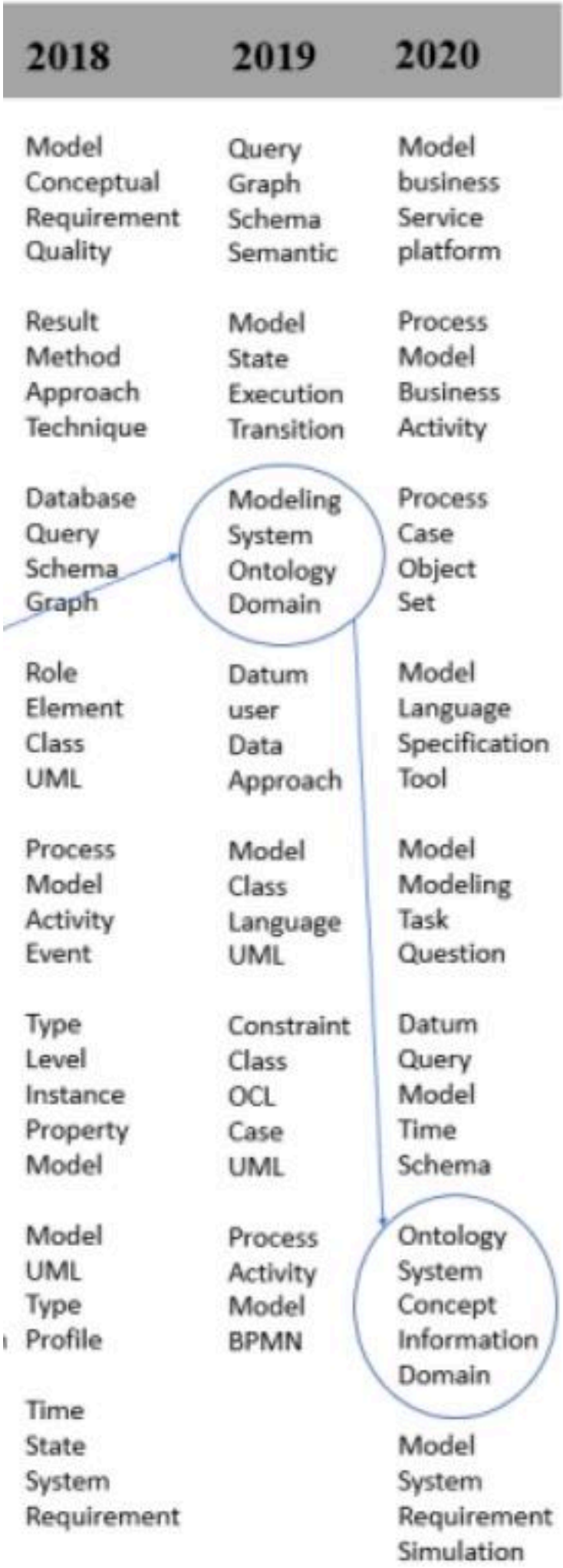
# Conceptual Modeling: Topics, Themes, and Technology Trends

5,300 papers from 35 related journals and conferences  
(ER, CAiSE, ICIS, AMCIS, EMISAJ, DKE, ...)

1976--2022

natural language processing (LDA)

quantitative + qualitative analysis



business process design and execution

business modeling and mining

process analysis

modeling languages

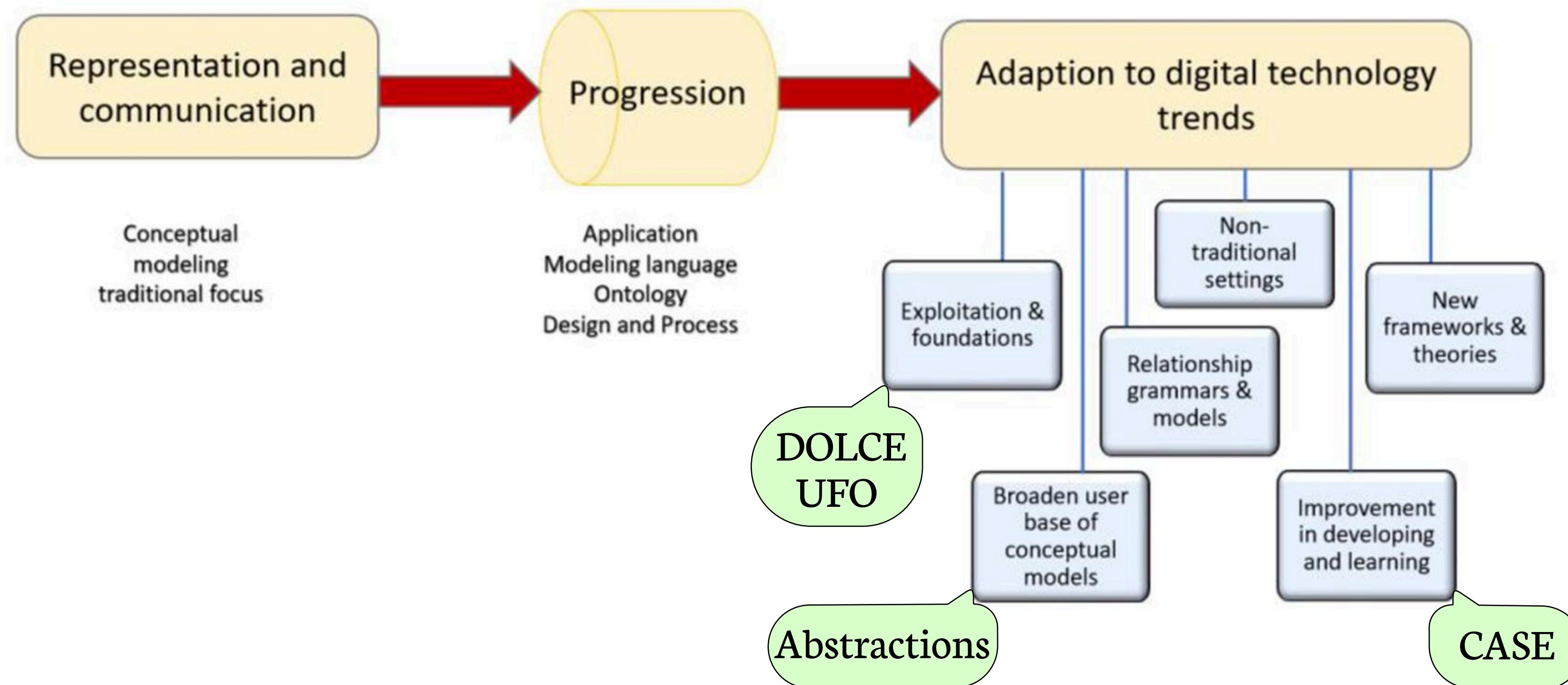
empirical evaluations

data models

**ontology**

software engineering

# Conceptual Modeling: Topics, Themes, and Technology Trends



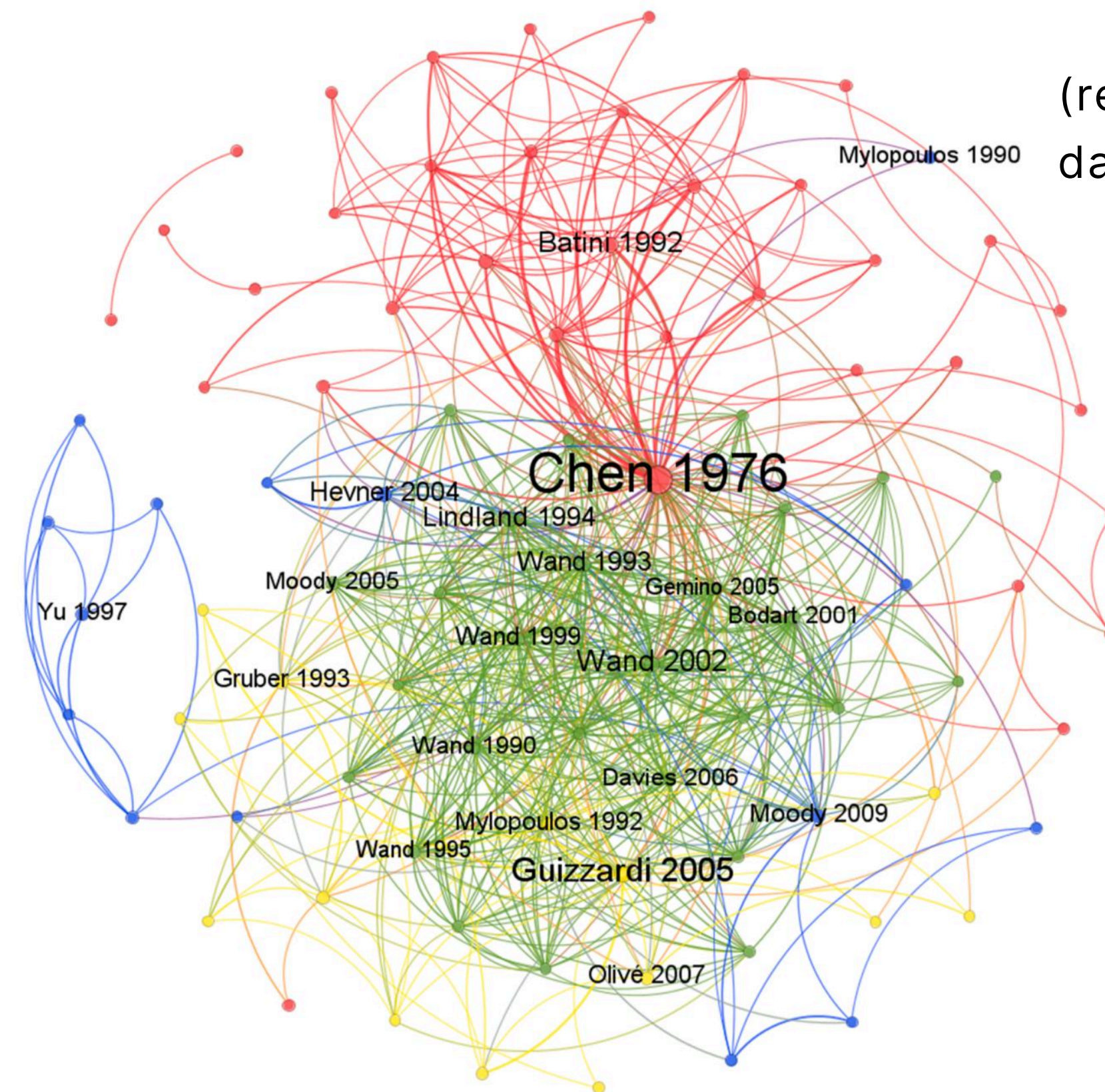


# Unraveling the foundations and the evolution of conceptual modeling

4 742 documents and  
110 718 (73 018 unique) cited references

1976--2023

three types of bibliometric analysis:  
co-citation analysis (CCA),  
bibliographic coupling analysis (BCA), and  
main path analysis (MPA)



(red) Conceptual modeling and  
databases

(green) Grammars and guidelines  
for conceptual modeling

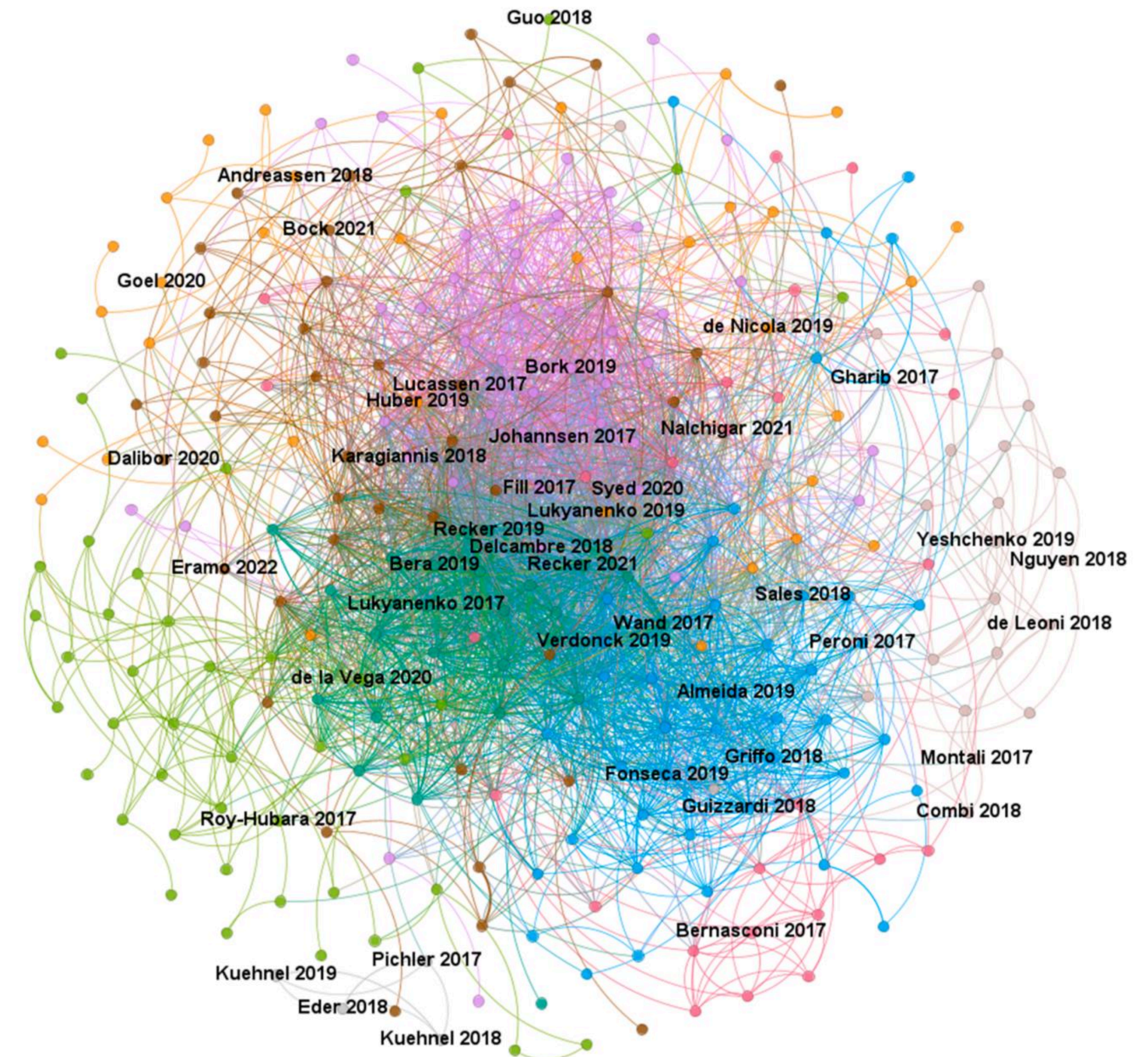
(blue) Requirements engineering  
and IS design methodologies

**(yellow) Ontology constructs for  
conceptual modeling**



# Unraveling the foundations and the evolution of conceptual modeling

- Domain-specific CM
- **Ontologies and applications**
- Data and databases: datastore, NoSQL, multimodel data
- Goal models and requirements engineering
- Applications with or without ontologies
- Applications to genomics and healthcare
- **Understanding CM**; theoretical developments
- Process model including process modeling, process mining
- Temporal or economic view of the field





# Foundational ontologies in action

Borgo, Stefano | Galton, Antony | Kutz, Oliver  
Applied Ontology, vol. 17, no. 1, pp. 1-16, 2022

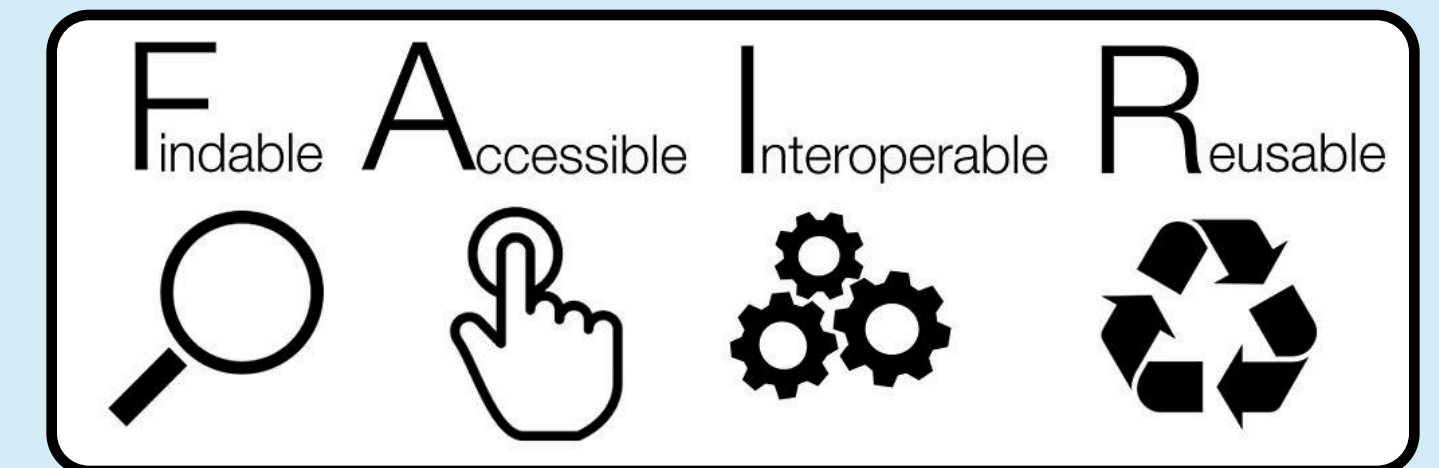
1. BFO: Basic Formal Ontology
2. DOLCE: Descriptive Ontology for Linguistic and Cognitive Engineering
3. GFO: General Formal Ontology
4. GUM: Generalized Upper Model
5. TUpper: A Top Level Ontology within Standards
6. **UFO: Unified Foundational Ontology**
7. YAMATO: Yet Another More Advanced Top-level Ontology



1. **UFO**  
a well-grounded foundational ontology based on contributions from Formal Ontology in Philosophy, Philosophical Logic, Cognitive Psychology, and Linguistics.

2. **OntoUML**  
an ontology-driven conceptual modeling language that extends class diagrams in the UML by defining a set of stereotypes that reflect UFO ontological distinctions into language constructs.

3. **FAIR Catalog**





The **FAIR Model Catalog** for Ontology-Driven Conceptual Modeling Research, commonly referred to as OntoUML/UFO Catalog, is a structured and open-source catalog that contains OntoUML and UFO ontology models. It was conceived to allow collaborative work and to be easily accessible to all its users.

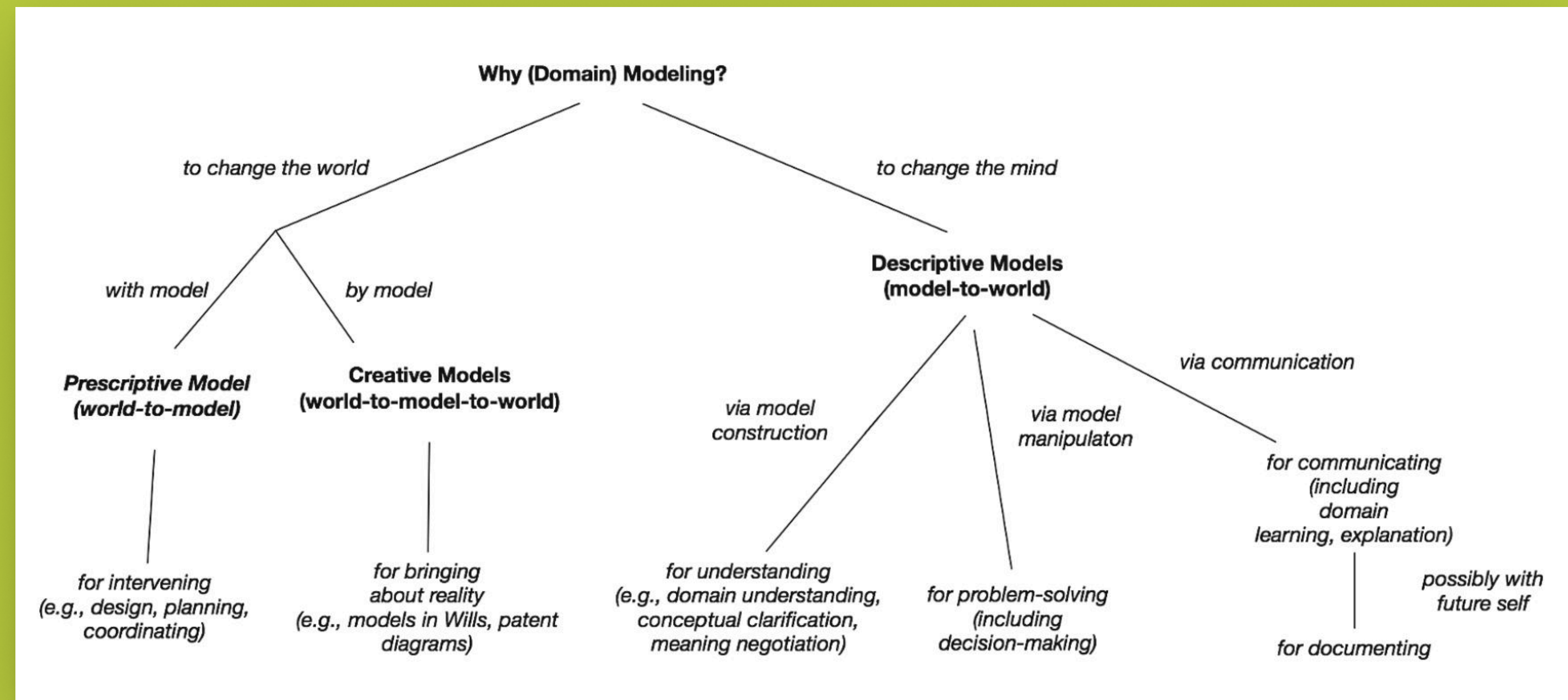
The goal of the OntoUML/UFO Catalog is to support empirical research in OntoUML and UFO, as well as for the general conceptual modeling area, by providing high-quality curated, structured, and machine-processable data on why, where, and how different modeling approaches are used.

185 ODCMs  
from 7 to 3760  
classes  
up to 1782 relations  
issued from 2005 to 2024



# Why we use CMs?

Intervening  
Understanding  
Problem-solving  
Communicating  
Documenting  
Learning



Guizzardi, G., Proper, H.A.

On understanding the value of domain modeling.

In: 15th International Workshop on Value Modelling and Business Ontologies, pp.51-62 (2021)

Valle Sousa, et al.

What Do I Get from Modeling?

In: EDOC 2023. LNCS, vol 14367.



# Why we use CMs?

Intervening  
Understanding  
Problem-solving  
Communicating  
Documenting  
Learning

# Do we use CMs?

YES

And even with the  
competency  
questions!

Monfardini, Glaice Kelly Q et al.

Use of Competency Questions in Ontology Engineering: A Survey.

In: Conceptual Modeling. vol. 14320. pp. 45-64 (2023)

# Why we use CMs?

Intervening  
Understanding  
Problem-solving  
Communicating  
Documenting  
Learning

# Do we use CMs?

YES

And even with the competency questions!

# Do we reuse CMs?

“36.38% of the ontologies registered in LOV could not be appropriately loaded.”

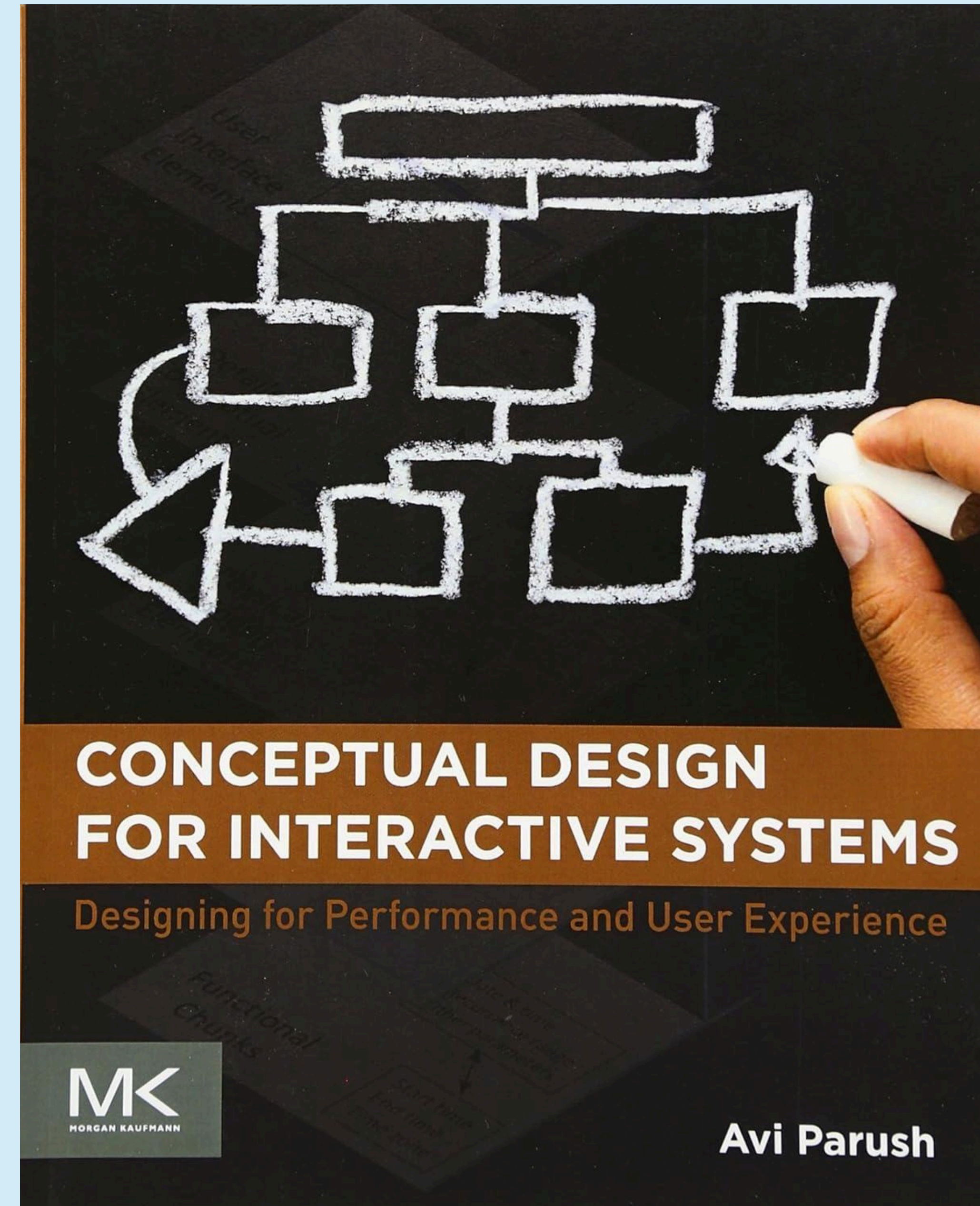
Fernández-López, M. et al.

Why are ontologies not reused across the same domain?

Web semantics, 2019-08, Vol.57, p.100492



If you understand it,  
you can use it!







# CIDOC Conceptual Reference Model

🌐 6 languages ▼

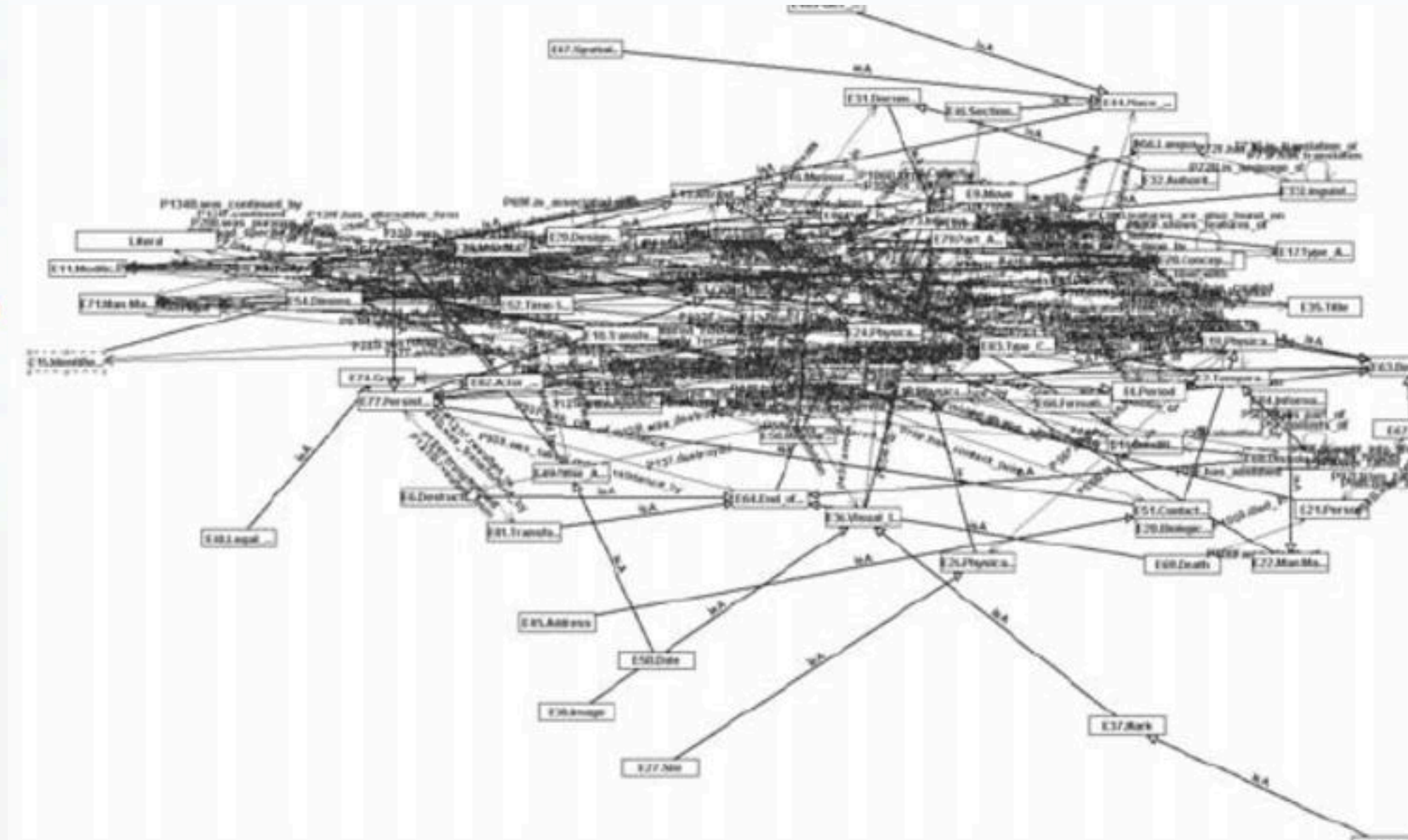
Article [Talk](#)

[Read](#) [Edit](#) [View history](#) [Tools](#) ▼

From Wikipedia, the free encyclopedia

The **CIDOC Conceptual Reference Model (CRM)** provides an extensible [ontology](#) for [concepts](#) and [information](#) in [cultural heritage](#) and [museum documentation](#). It is the [international standard \(ISO 21127:2023\)](#) for the controlled exchange of cultural heritage information.<sup>[1]</sup> [Galleries](#), [libraries](#), [archives](#), [museums](#) ([GLAMs](#)), and other cultural institutions are encouraged to use the CIDOC CRM to enhance accessibility to museum-related information and [knowledge](#).





Tzitzikas, Y., Kotzinos, D., Theoharis, Y.

On Ranking RDF Schema Elements (and its Application in Visualization)

Journal of Universal Computer Science 13(12), 1854-1880 (2007)

1.  
**understanding** is  
a cognitive process,  
a process of  
abductive  
inference for  
‘filling the gaps’

Chin-Parker, S., Bradner, A.  
Background shifts affect explanatory style: how a pragmatic  
theory of explanation accounts for background effects in the  
generation of explanations.  
Cogn. Process 11, pp. 227–249 (2010).

2.  
**interpretation** is  
an opinion of what  
something means

Cambridge Dict.

Marques-Silva, J., Ignatiev, A.  
No silver bullet: interpretable ML models must  
be explained  
Front. Artif. Intell., vol. 6 (2023)

3.  
scientific  
**explanation** may  
be regarded as an  
answer to a why-  
question

Hempel, C. G.  
Aspects of scientific explanation  
In: Aspects of scientific explanation and other  
essays in the philosophy of science.  
2nd printed. Free press Collier-Macmillan, pp.  
331–496.



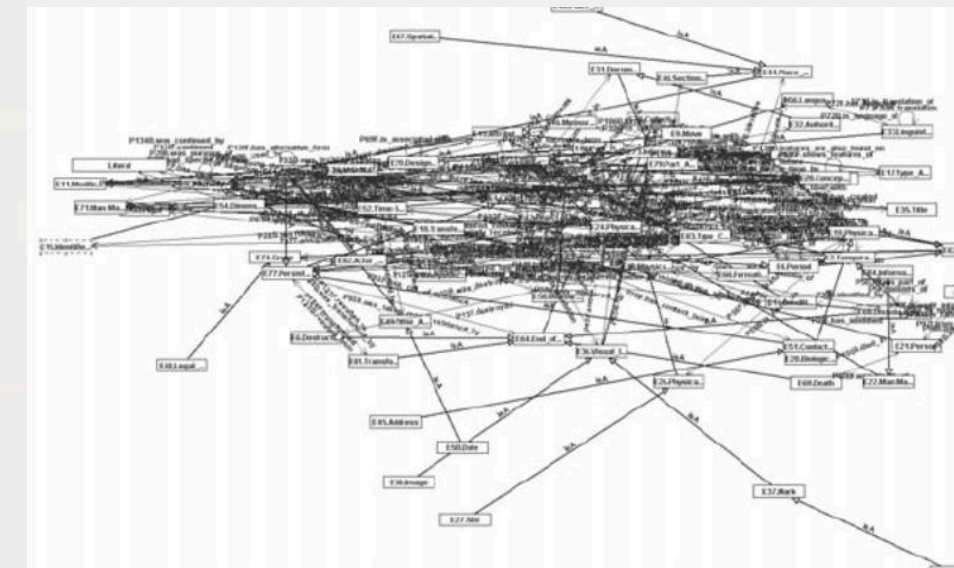
# understanding

“understanding is an intrinsic good provided by explanation”  
(Lipton, P., 2004)

“understanding the world is the intellectual benefit we expect to acquire by constructing explanations”  
(Weber, E., Van Bouwel, J., De Vreese, L., 2013)

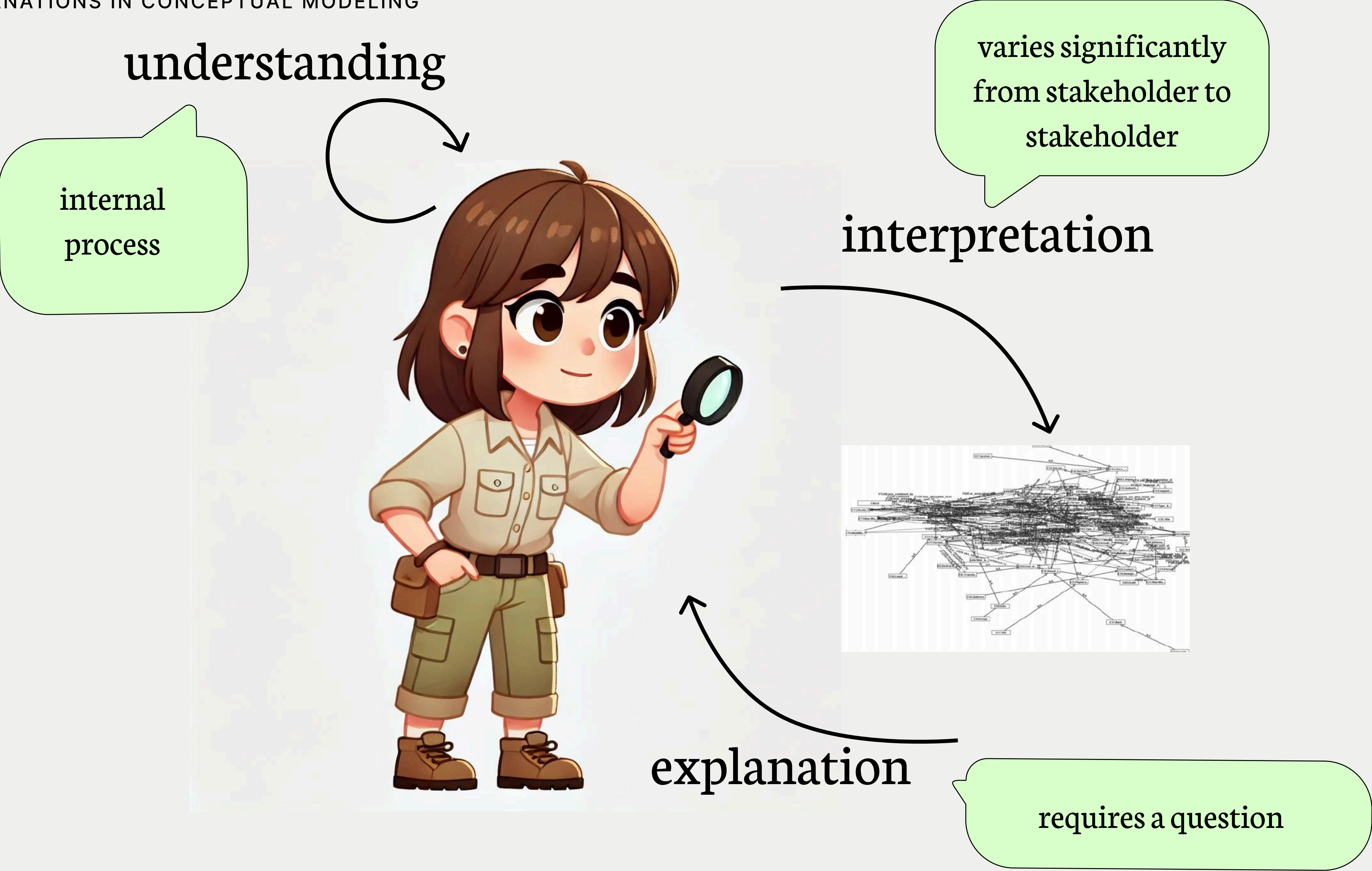


# interpretation

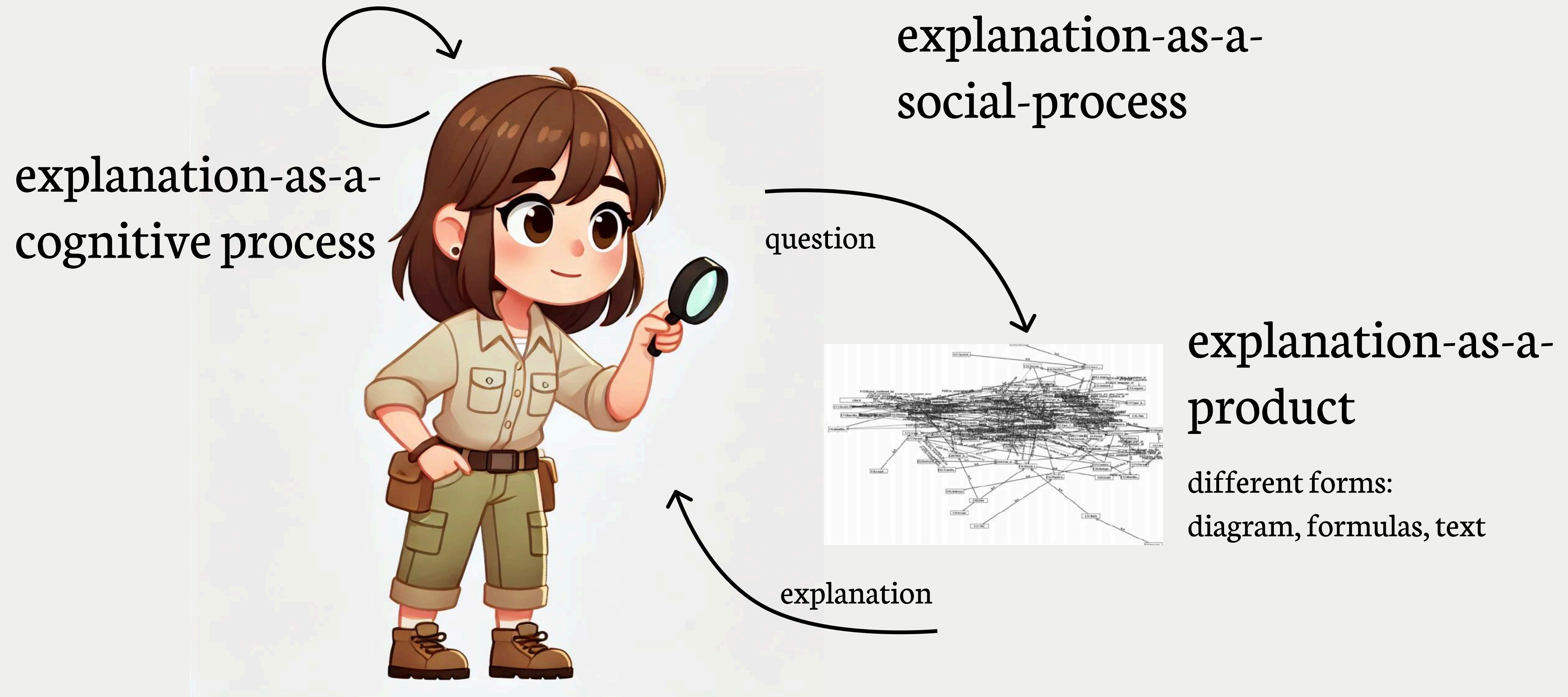


# explanation

“explanations are the primary means by which people construct an understanding of the world”  
(Horne, Z., Muradoglu, M., Cimpian, A., 2019.)







Miller, T.

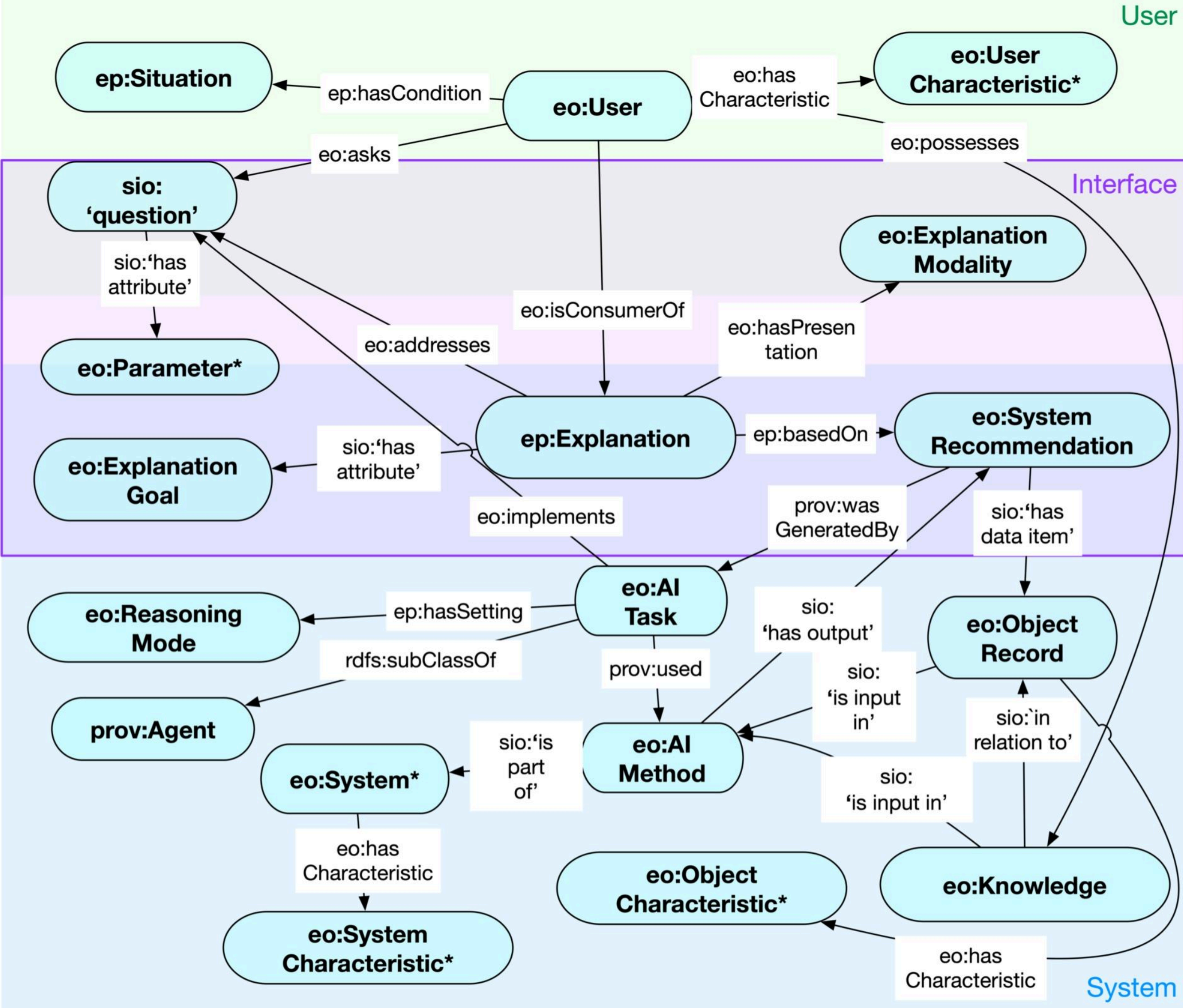
Explanation in artificial intelligence: Insights from the social sciences.

In: Artificial Intelligence 267, pp. 1–38 (2019)

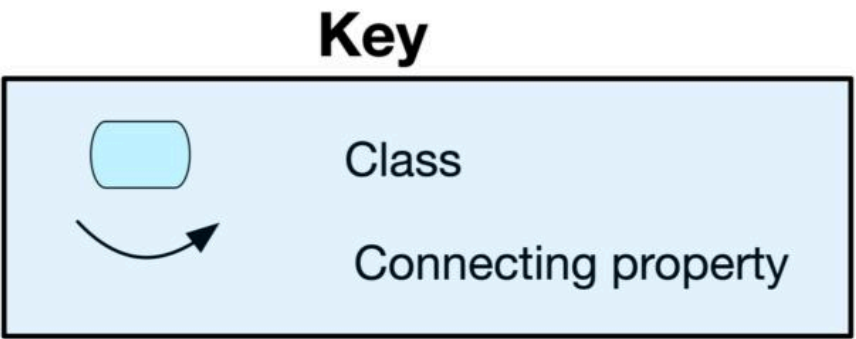


# Explanation Ontology

case based  
contextual  
contrastive  
counterfactual  
everyday  
scientific  
statistical  
...



\*Classes introduced in EO version 2.0



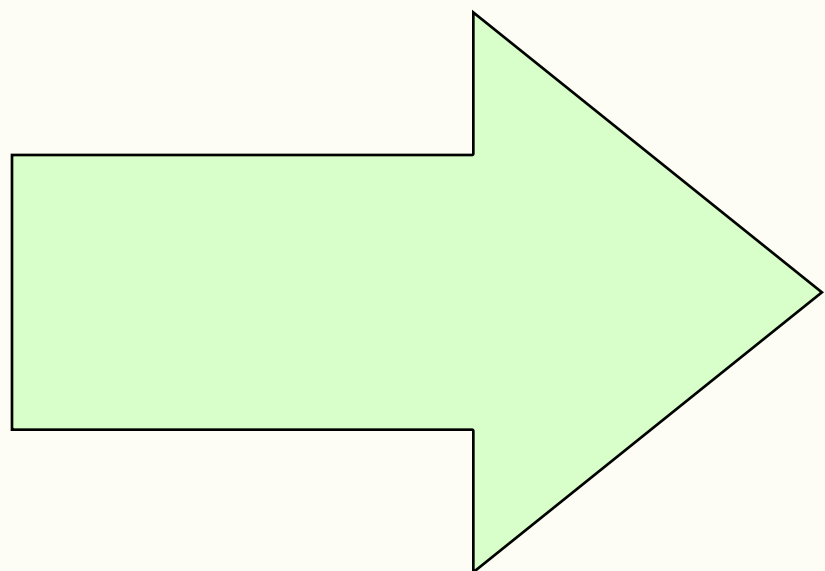
**Prefixes**

eo	Explanation Ontology
ep	Explanation Patterns Ontology
sio	SemanticScience Integrated Ontoogy
prov	Prov-O

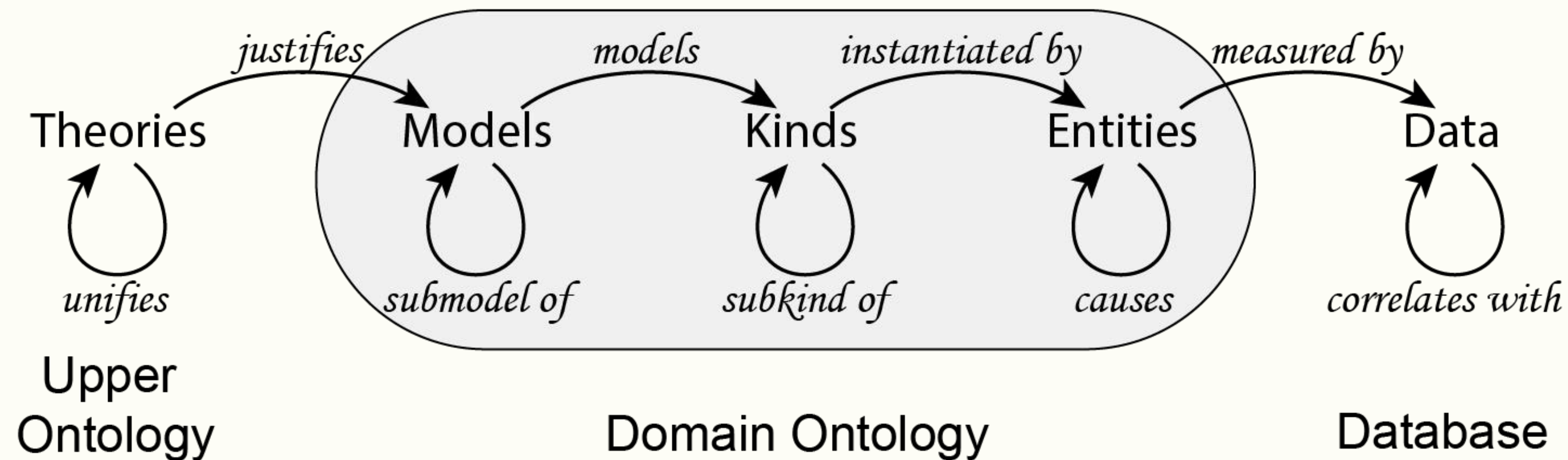


# PRAGMATIC APPROACH

1. Make context-dependent normative claims and argue for them.
2. Make context-dependent descriptive claims and argue for them.
3. Take into account the epistemic interests while doing this.



Romanenko, E., Calvanese, D., Guizzardi, G.  
Towards Pragmatic Explanations for Domain Ontologies.  
In: EKAW. Vol. 13514. LNCS, pp. 201–208 (2022)



An **explanation** of the ODCM with respect for a given question is an **ODCM view** sufficient to answer that question.

An **ODCM view** is a model obtained from the given one by applying one or more **explanation transformations** that preserve the consistency of the model.



# How can we generate the questions?

# 1.

Competency  
Questions

“one should construct the model so that these questions can be answered, and, to the extent possible, model no further than necessary to answer them”

Allemang, D., Hendler, J.

Chapter 14 - good and bad modeling practices.

In: Semantic Web for the Working Ontologist, pp. 307–324 (2011)

# How can we generate the questions?

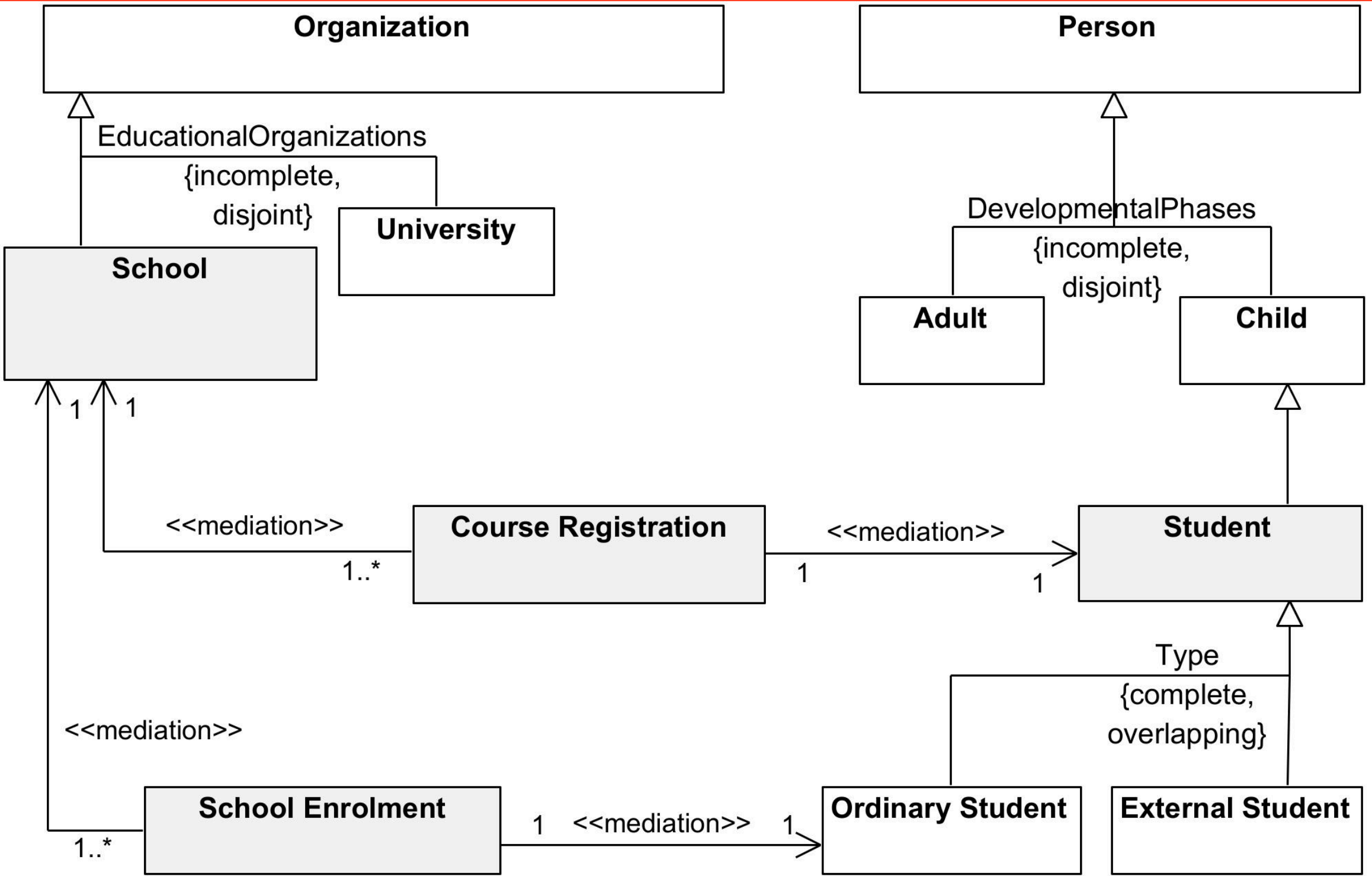
1.

Competency  
Questions

2.

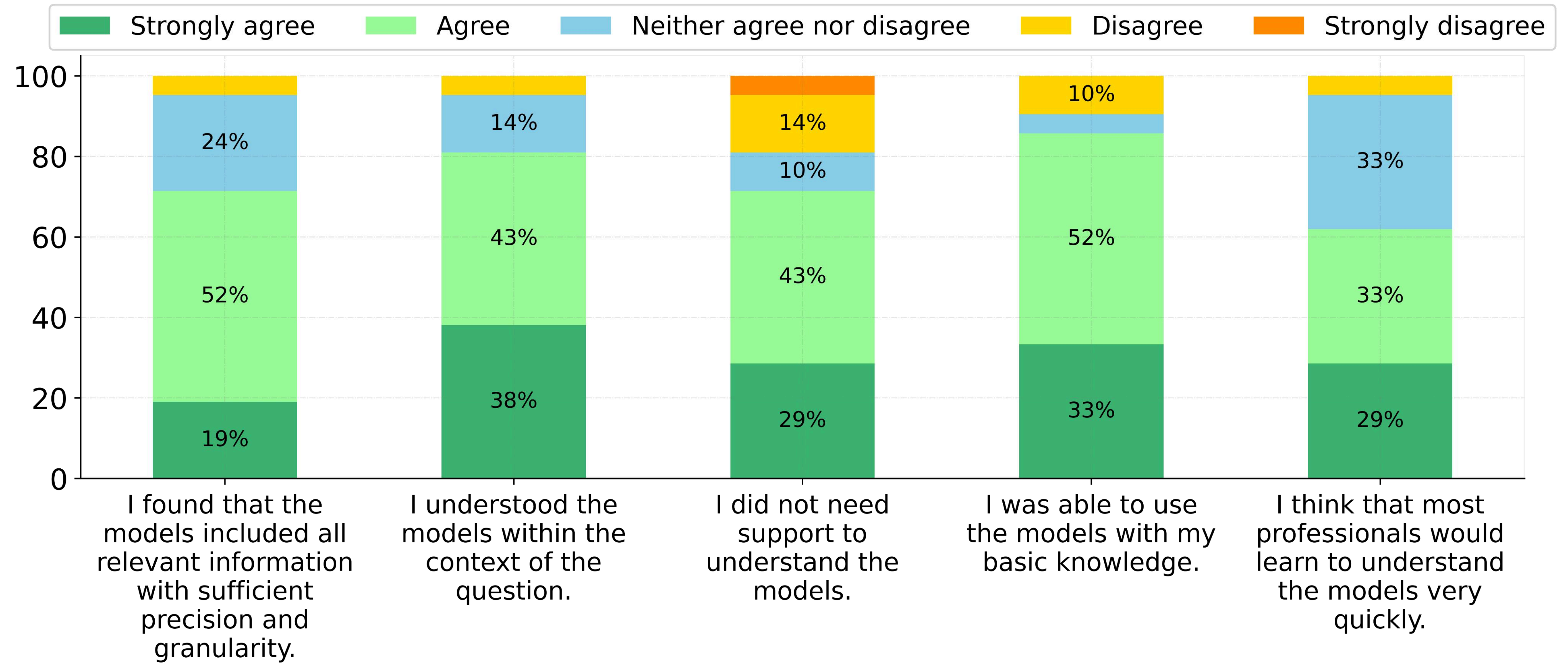
Pattern-based  
Approach





Can the Student be an Ordinary student and an External student at the same time?

Yes, even if the Student has Enrolment in one School, he can be an External Student in another School.

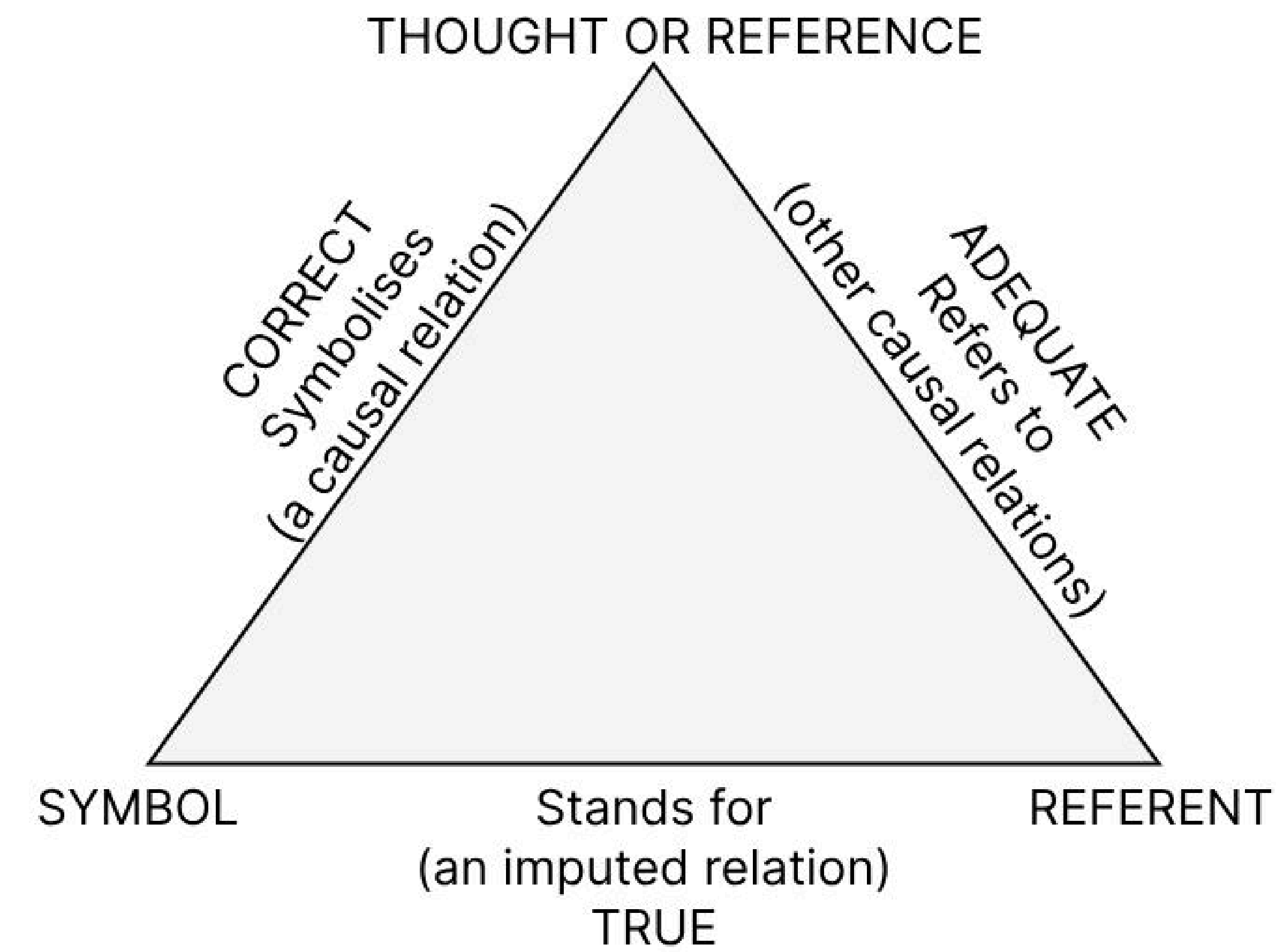




# EXPLAINING AN EXPLANATION

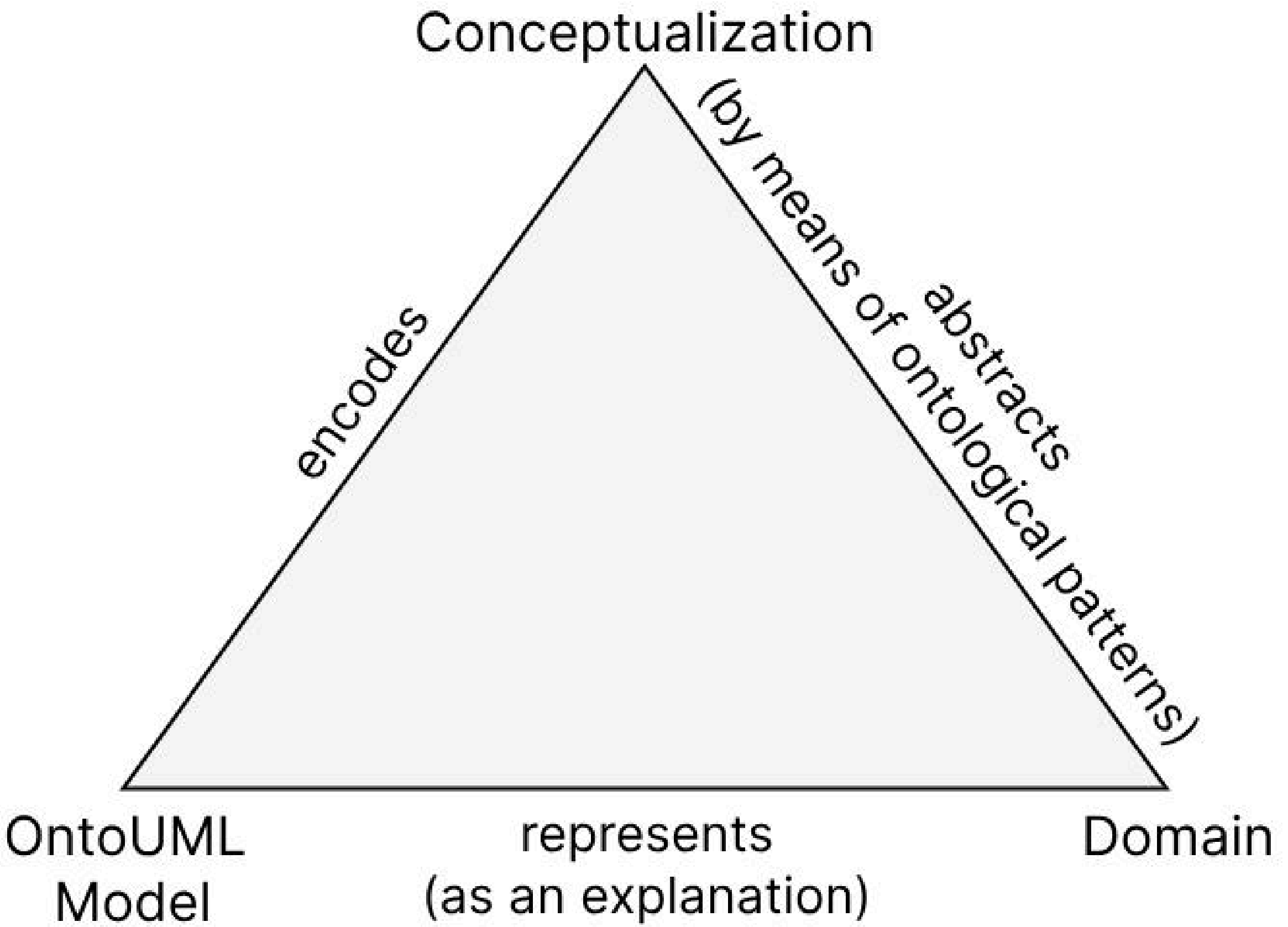
# ABSTRACTING AN ABSTRACTION





THE TRIANGLE OF REFERENCE

Ogden, C. K., Richards, I.A. Meaning of Meaning. (1989)

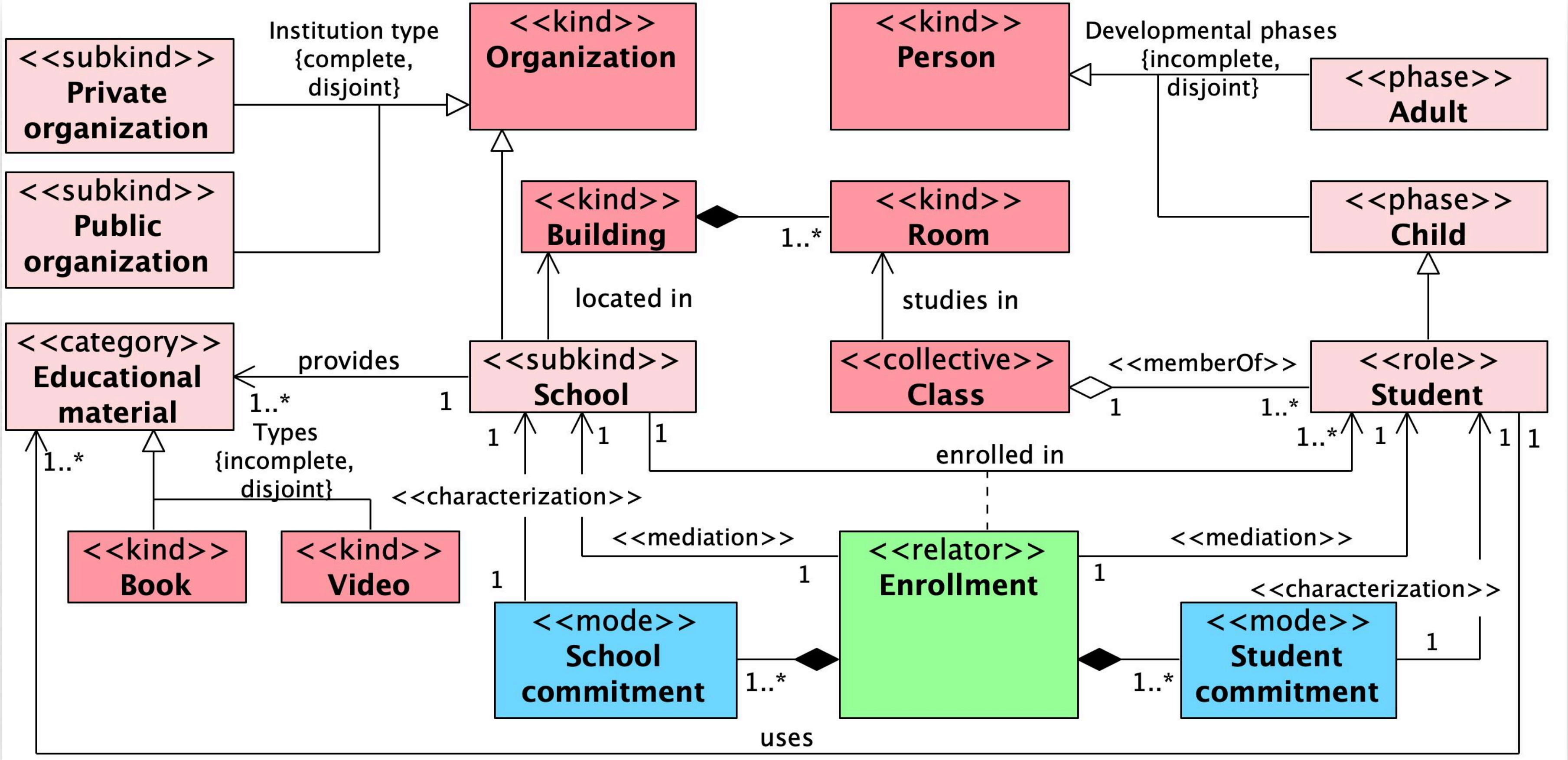


INTERPRETATION OF THE TRIANGLE OF REFERENCE FOR THE CONCEPTUAL MODELING CASE

# Abstraction can be a part of the explanation process

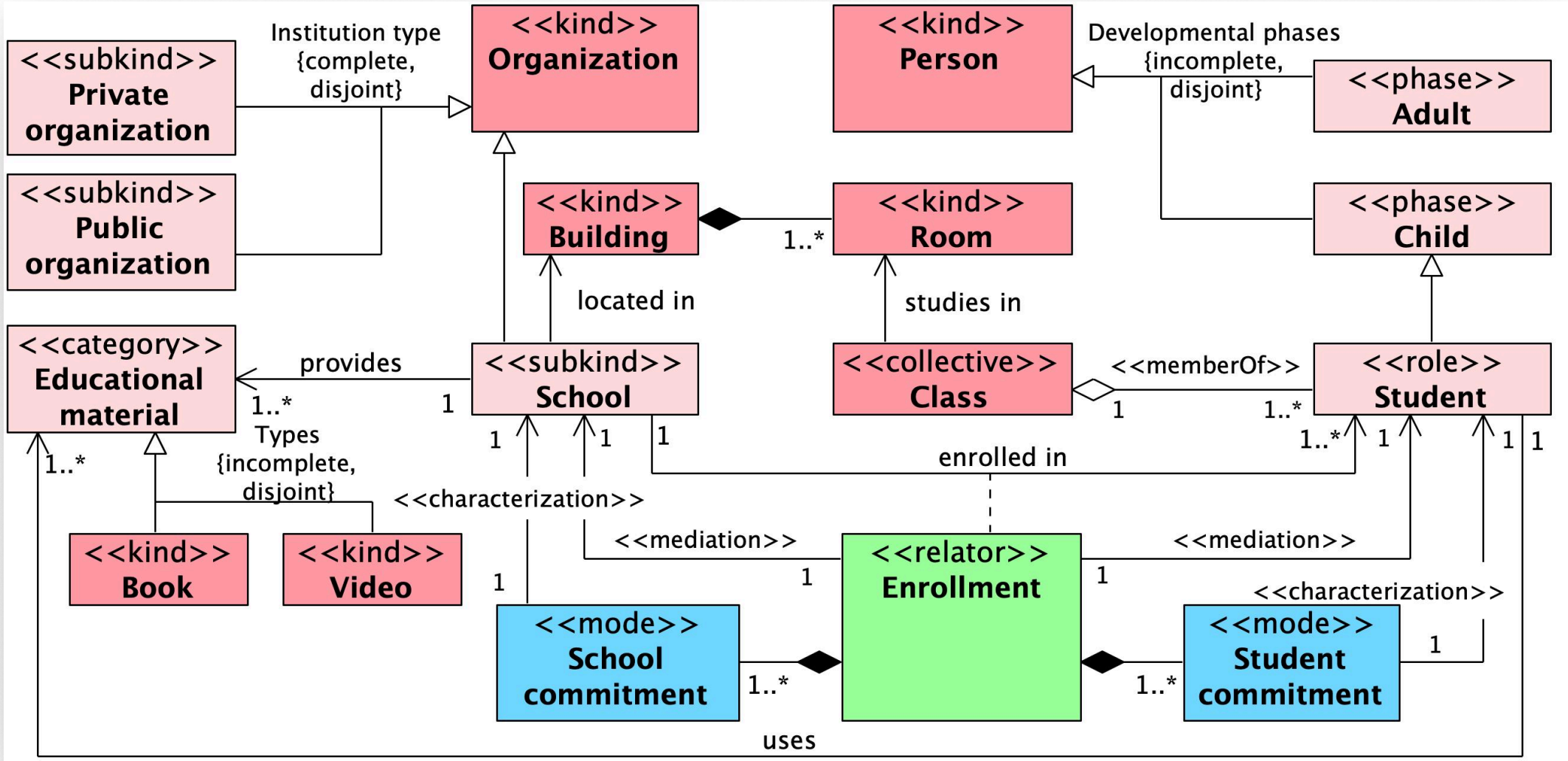
Romanenko, E., Calvanese, D., Guizzardi, G.  
Evaluating quality of ontology-driven conceptual models abstractions.  
In: Data & Knowledge Engineering 153, p. 102342.





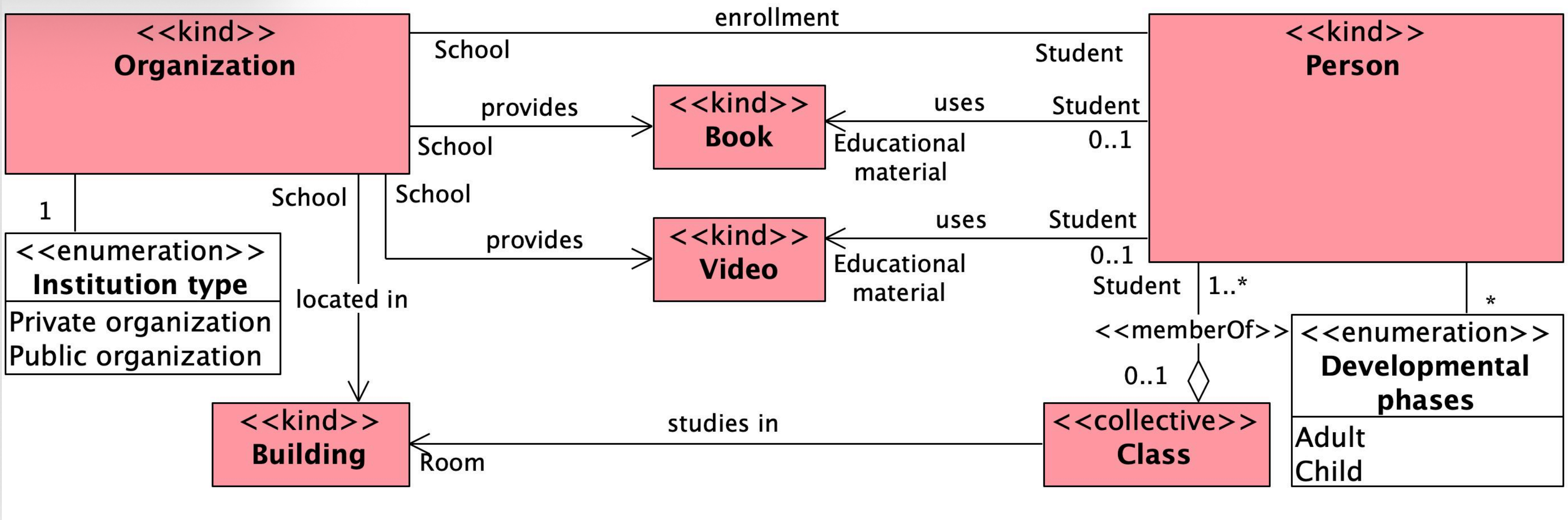
ORIGINAL MODEL



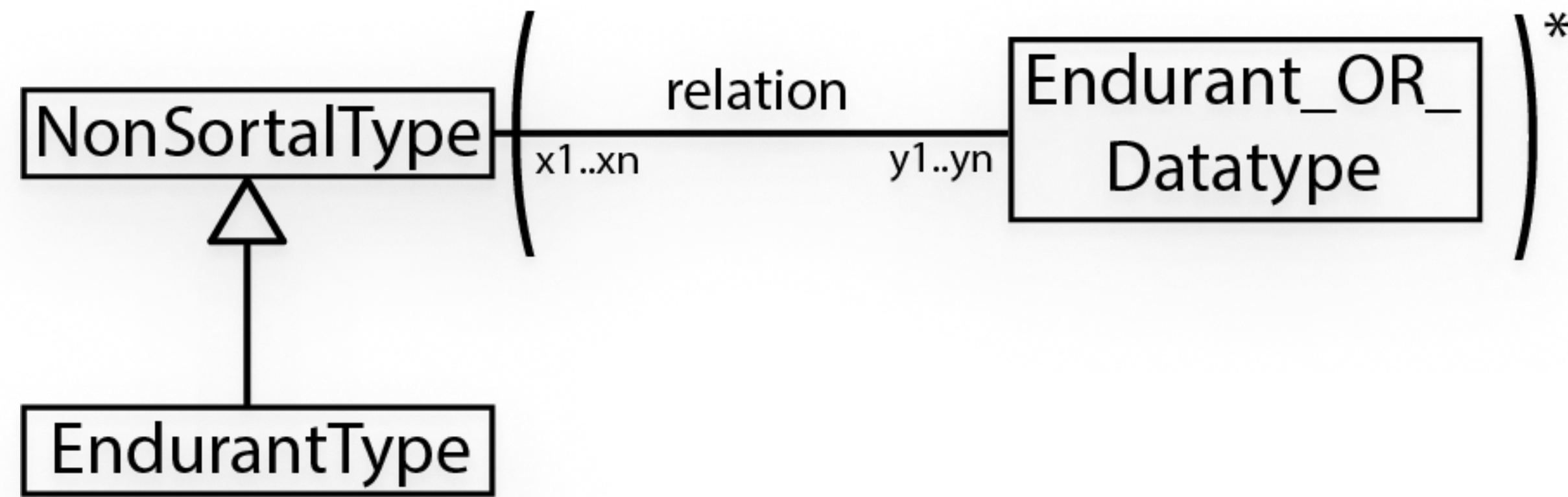


ORIGINAL MODEL

ABSTRACTED MODEL



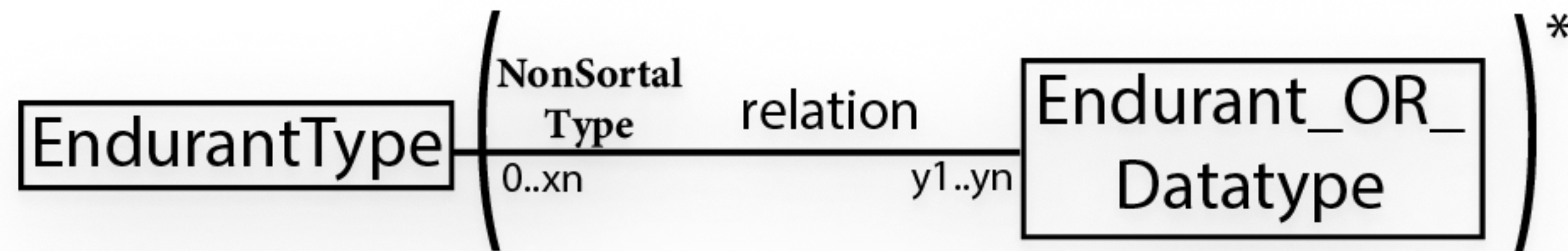




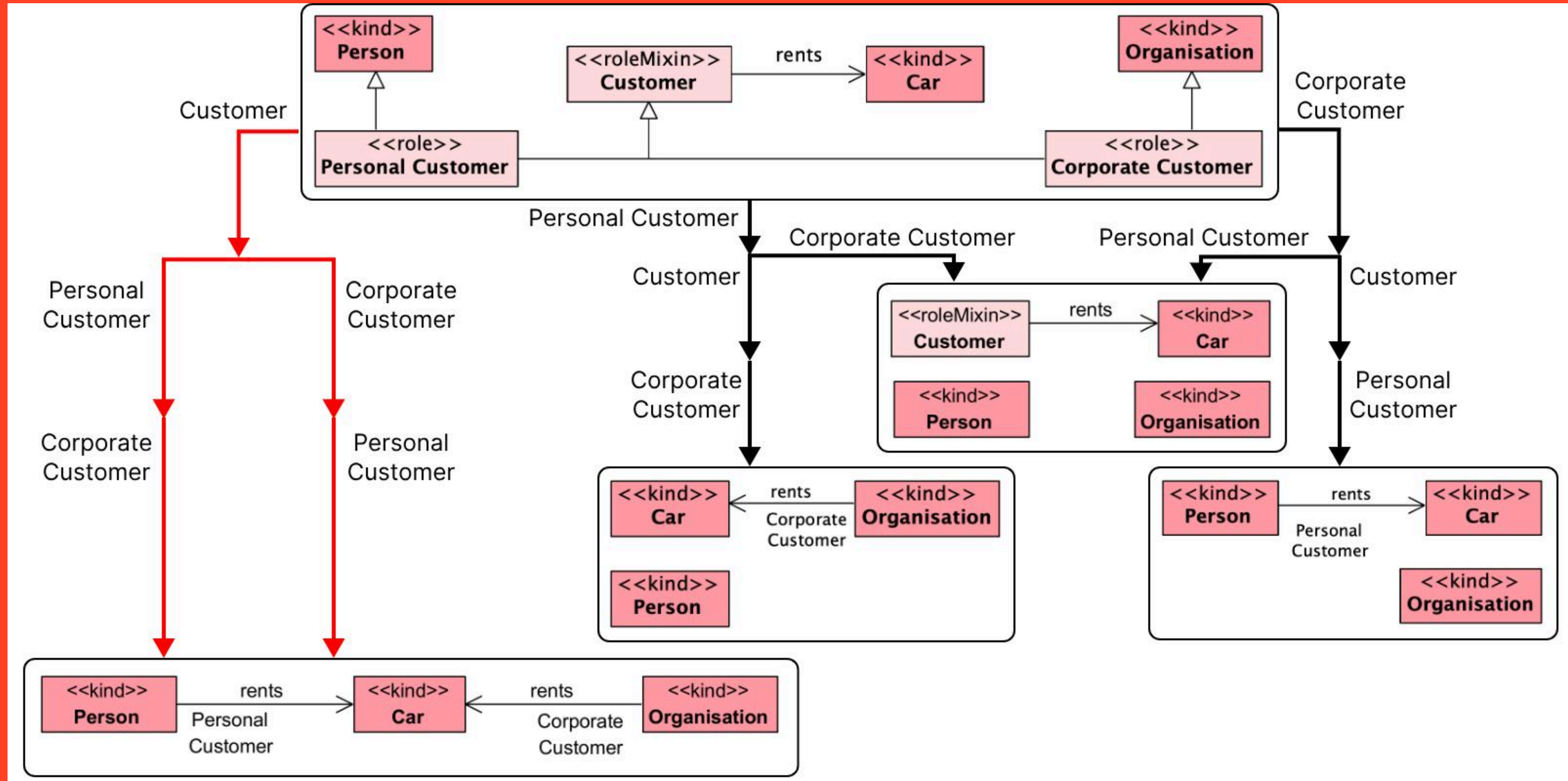
ORIGINAL MODEL

# Abstraction algorithm leveraging the semantics of UFO

1. Extended version
2. 11 rules
3. No seeding
4. Rules are in fact patterns
5. Allows the appearance of hierarchies



REPLACEMENT



Romanenko, E. et al.

Towards Semantics for Abstractions in Ontology-Driven Conceptual Modeling.

In: Proc. of the ER 2023 Workshops (OntoCom). Vol. 14319. LNCS, pp. 199–209.



# Abstraction of conceptual models as a weakening process



# ABSTRACTION

Abstraction is a mapping from a **ground** (original) to an **abstracted** (intended) space  
(Saitta & Zucker, 2013)

- Plaisted, D.A.: Theorem proving with abstraction. *Artificial intelligence* 16(1), 47–108 (1981)
- Hobbs, J.R.: Granularity. In: *Proc. of the 9th IJCAI*, vol. 1, 432–435 (1985)
- Tenenberg, J.D.: Preserving consistency across abstraction mappings. In: *Proc. of the 10th IJCAI*, 1011–1014 (1987)
- **Giunchiglia, F., Walsh, T.: A theory of abstraction. *Artificial intelligence* 57(2), 323–389 (1992)**
- Nayak, P.P., Levy, A.Y.: A semantic theory of abstractions. In: *Proc. of the 14th IJCAI*, vol. 1, 196–202 (1995)
- Ghidini, C., Giunchiglia, F.: A semantics for abstraction. In: *Proc. of the 16th ECAI*, 338–342 (2003)

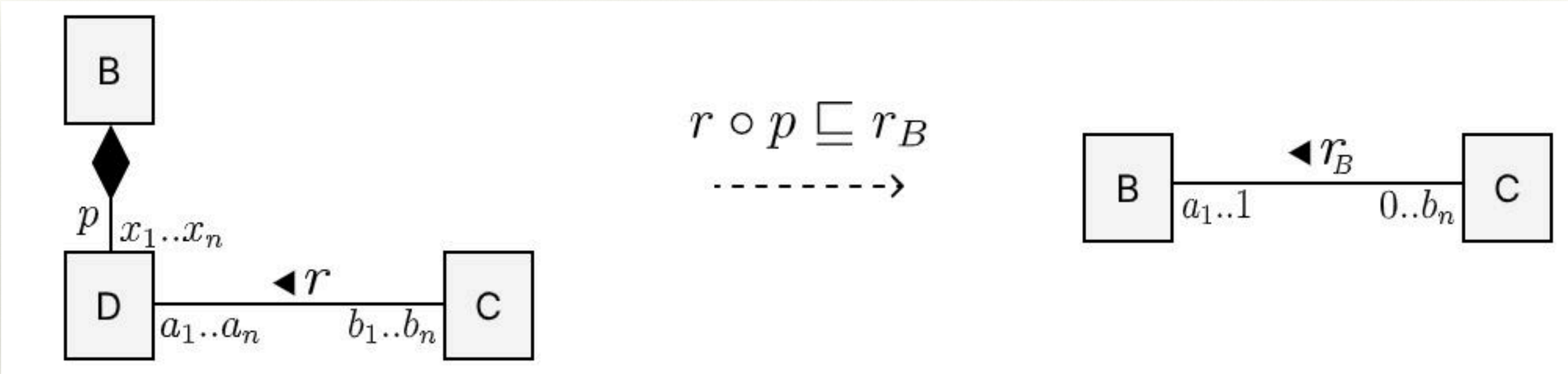
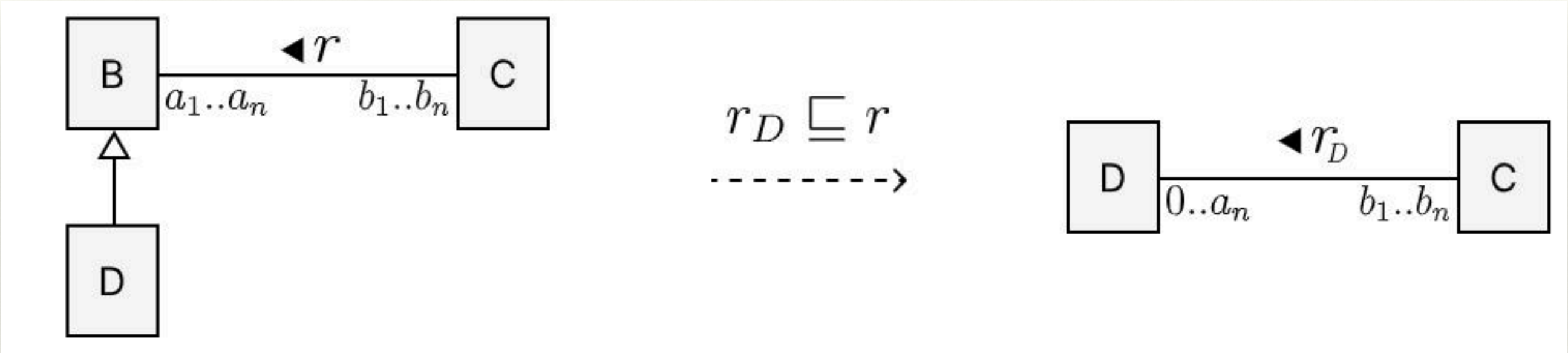
$$\mathfrak{I}_1 \models \mathfrak{I}_2$$



Axiom weakening is an approach that repairs ontologies by making axioms less restrictive.

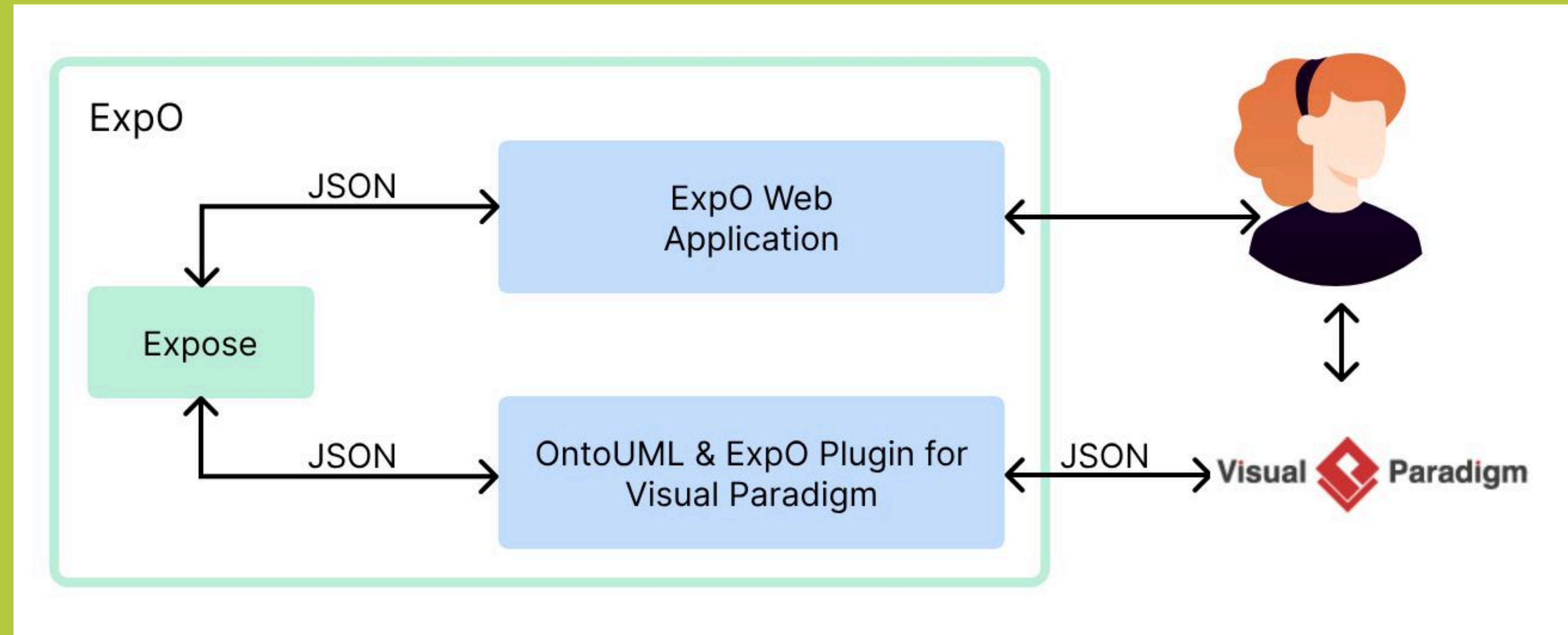
With some assumptions,  
abstraction can be  
considered as a  
weakening procedure

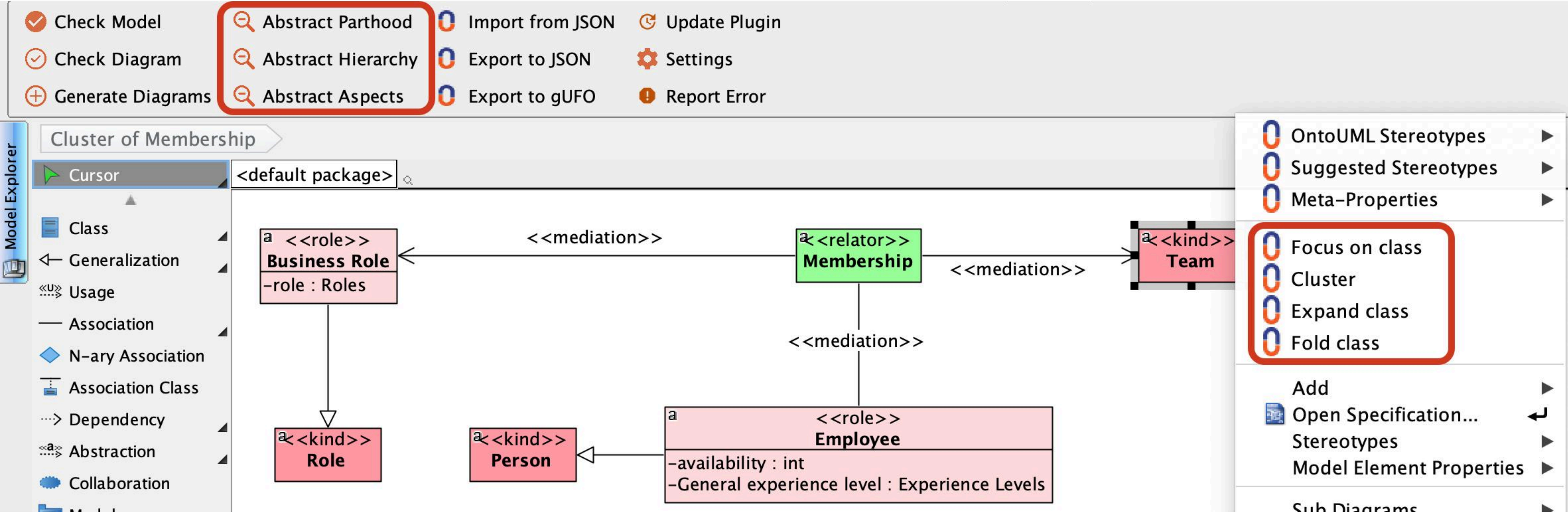
$$\mathfrak{I}_1 \oplus \mathfrak{I}_A \models \mathfrak{I}_2$$





# Please, meet ExpO prototype





ONTOUML & EXPO PLUGIN FOR VISUAL PARADIGM



EXPO WEB APPLICATION: [HTTPS://W3ID.ORG/EXPO](https://w3id.org/expo)

# Future directions

1. abstractions generated by GNNs
2. explanation as a weakening procedure
3. adaptation for the cases when the seeding is given



THANK YOU FOR  
YOUR ATTENTION