

# Ontology and Knowledge Representation

Introductory lecture  
Seminar, July 10-14, 2023

**Stefan Schulz**

Medical University of Graz (Austria)

Averbis GmbH, Freiburg (Germany)

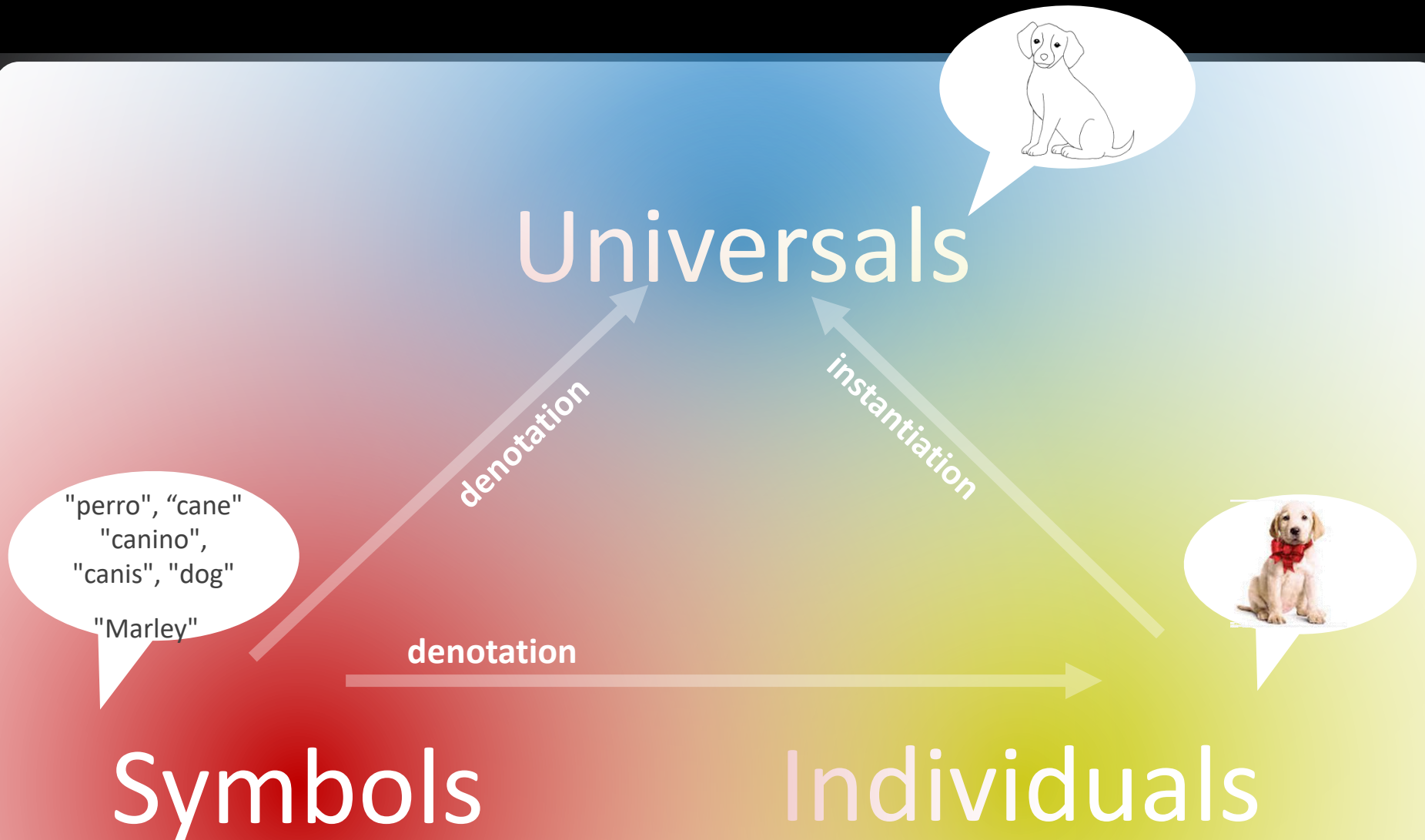


[stefan.schulz@medunigraz.at](mailto:stefan.schulz@medunigraz.at)

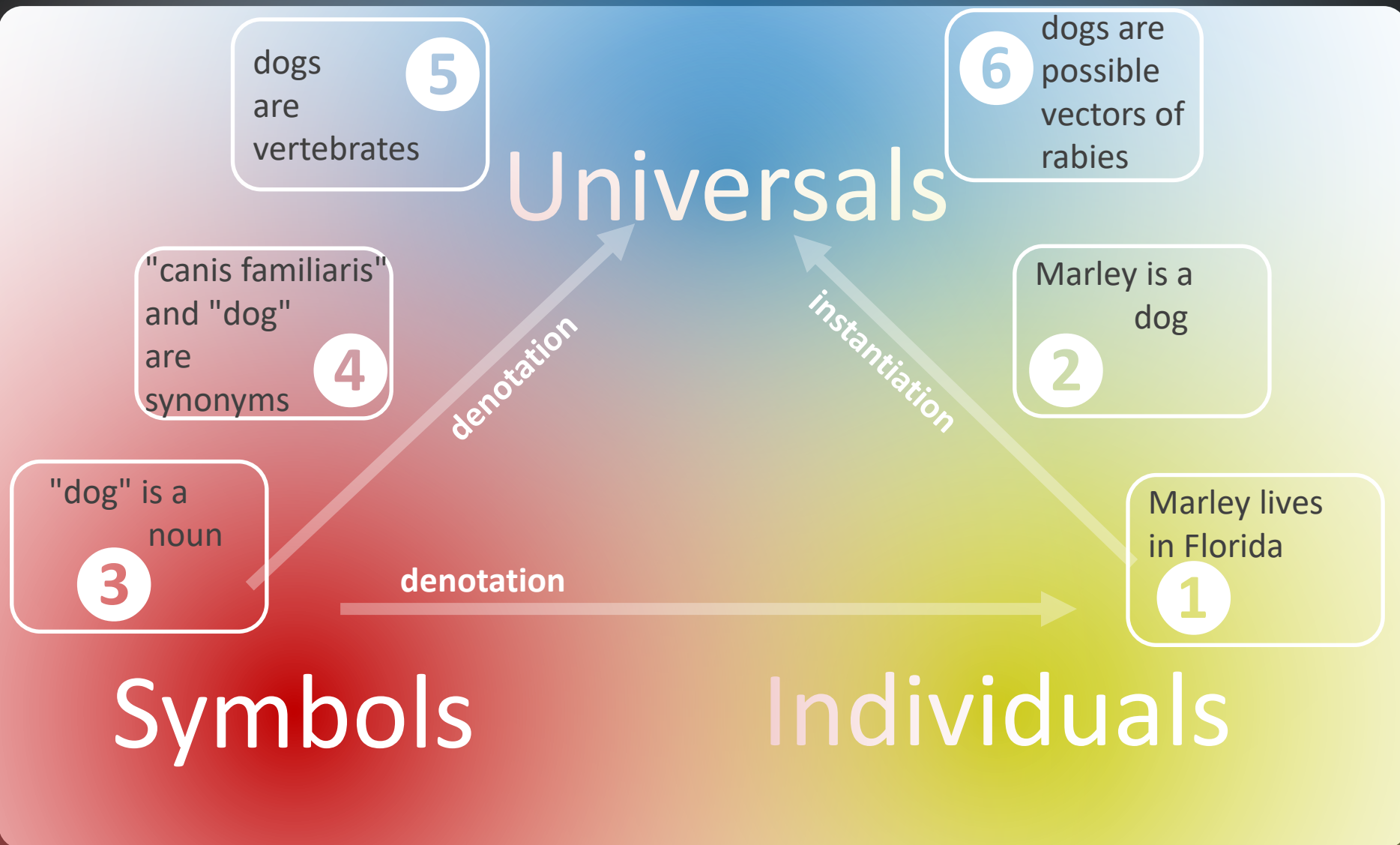
# Topics

- Context: representation of knowledge in natural sciences / engineering
  - What are the types of knowledge to distinguish
  - How are they connected
  - What are the most important resources?
- Fundamental theories:
  - Ontology: theory of being
  - Epistemology: theory of knowledge
  - Semiotics: theory of signs
  - Semantics: theory of linguistic signs

# Knowledge map



# Knowledge map

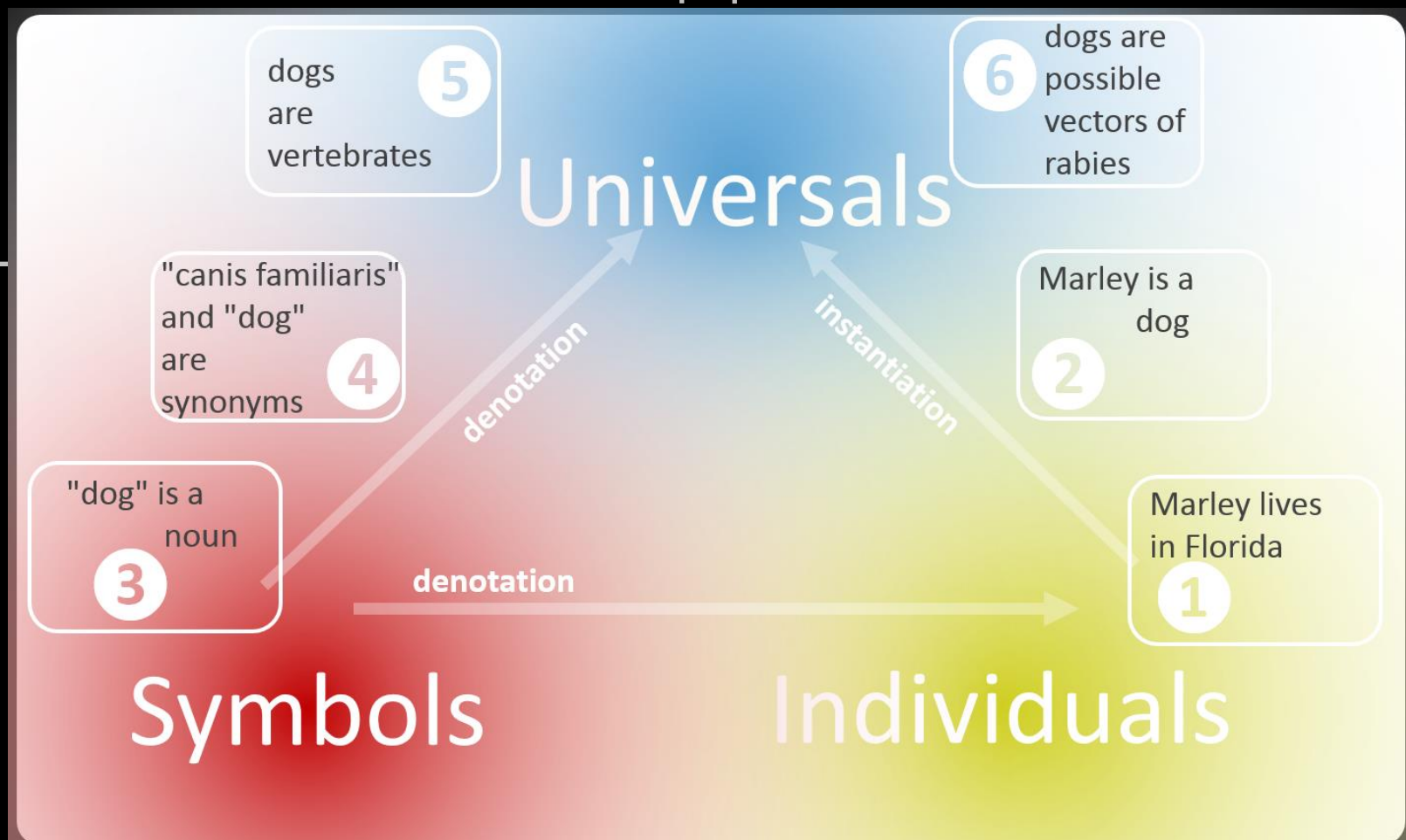


## Ontological knowledge:

Axioms that are universally true

## Contingent knowledge:

typical, likely, possible

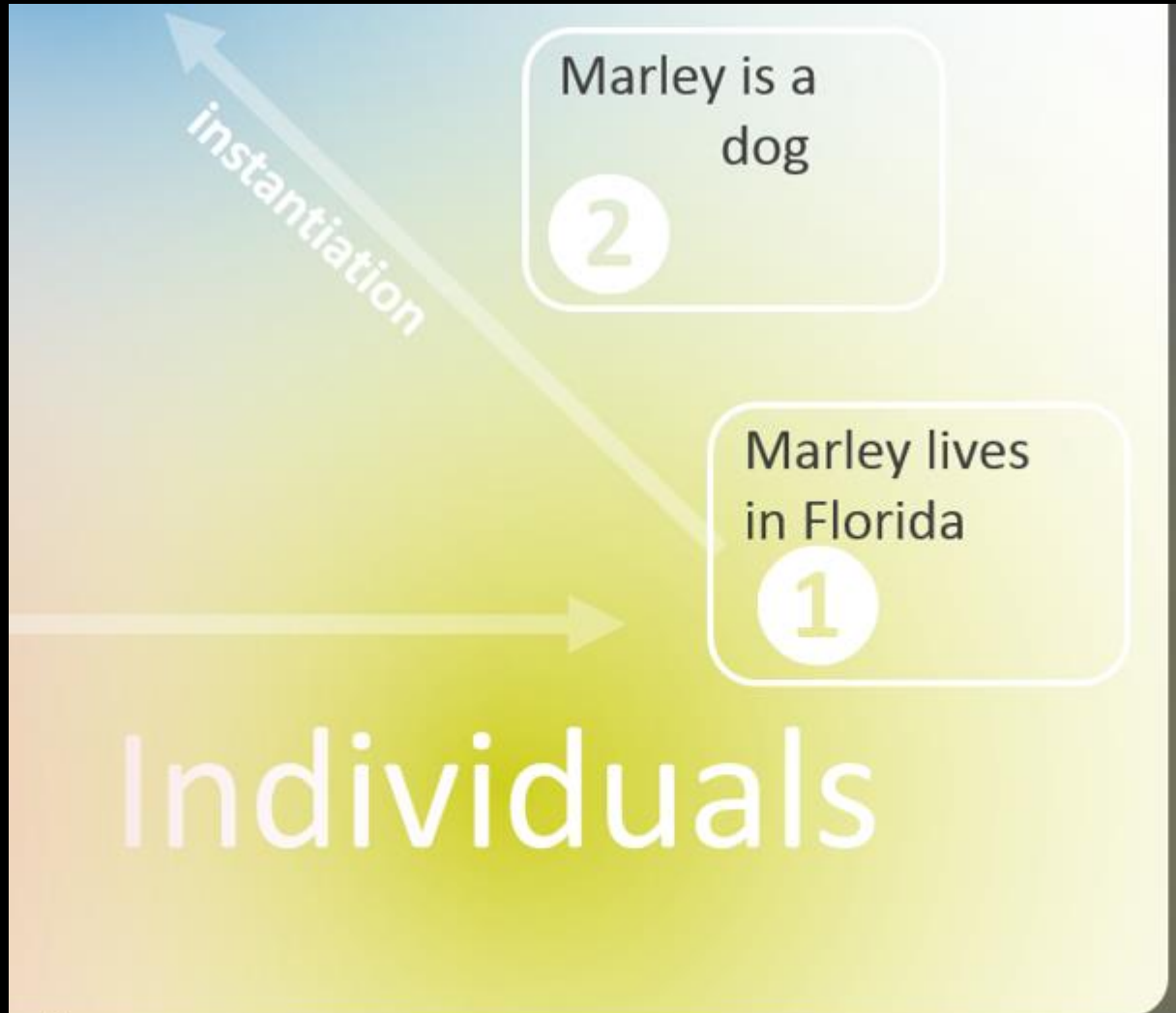


## Linguistic knowledge:

Statements about properties and meaning of signs of language

## Factual knowledge:

Statements about concrete entities and their relationships



**Factual knowledge:**

Statements about concrete entities  
and their relationships

# Statements at instance level

- RDF triples: data structures in RDF (Resource Description Framework) in the form of subject, predicate, object.
  - Subject: the entity to which the triple refers,
  - Predicate: relationship between subject and object
  - Object represents the value associated with this relationship.
  - Different syntaxes, e.g. TURTLE: <https://www.w3.org/TR/turtle/> more readable
- Example:

Subject (Resource)	Predicate (Property)	Object (Value)
<code>ex:Marley</code>	<code>ex:livesIn</code>	<code>ex:Montréal</code>
<code>ex:Marley</code>	<code>ex:isOwnedBy</code>	<code>ex:Pierre</code>
<code>ex:Marley</code>	<code>ex:owner</code>	<code>ex:Pierre</code>
<code>ex:Marley</code>	<code>ex:bornOn</code>	<code>ex:2019-02-03 (xsd:date)</code>
<code>ex:Marley</code>	<code>ex:bornIn</code>	<code>ex:Brussels</code>
<code>ex:Montréal</code>	<code>ex:capitalOf</code>	<code>ex:Québec</code>
<code>ex:Québec</code>	<code>ex:partOf</code>	<code>ex:Canada</code>
<code>ex:Brussels</code>	<code>ex:capitalOf</code>	<code>ex:Belgium</code>

# Exercise

- DBpedia is an online knowledge base that extracts structured information from Wikipedia
- The extracted data includes information about people, places, events, works, etc.
- Choose a term from Dbpedia, e.g. ex. <https://dbpedia.org/page/Montreal>
- Identify Triples
- A-Box : representation of particulars
- T-Box: representation of universals



# Statements between particulars and universals

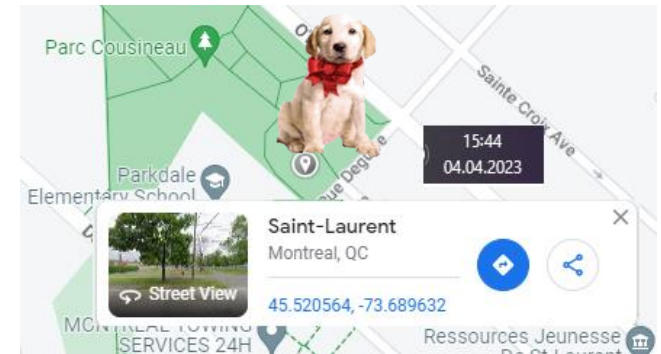
- Instantiation relationship "instance-of"
- Synonyms: "rdf:type", "a"
- Examples:

Subject (Resource)	Predicate (Property)	Object (Value)
<b>ex:Marley</b>	<b>a</b>	<b>ex:Dog</b>
<b>ex:Pierre</b>	<b>a</b>	<b>ex:Human</b>
<b>ex:Canada</b>	<b>a</b>	<b>ex:Country</b>
<b>ex:Montréal</b>	<b>a</b>	<b>ex:City</b>

- Dbpedia: <https://dbpedia.org/page/Brussels> rdf:type <https://dbpedia.org/page/Country>

# Statements between universals

- Type  $\approx$  Universal  $\approx$  Class  $\approx$  Concept ( $\approx$  Kind  $\approx$  Category):
  - which can be instantiated (500 M dogs...)
  - undefined in place and time
- Particular: that which cannot be instantiated
  - There is only one Marley
  - Specified in terms of place and time

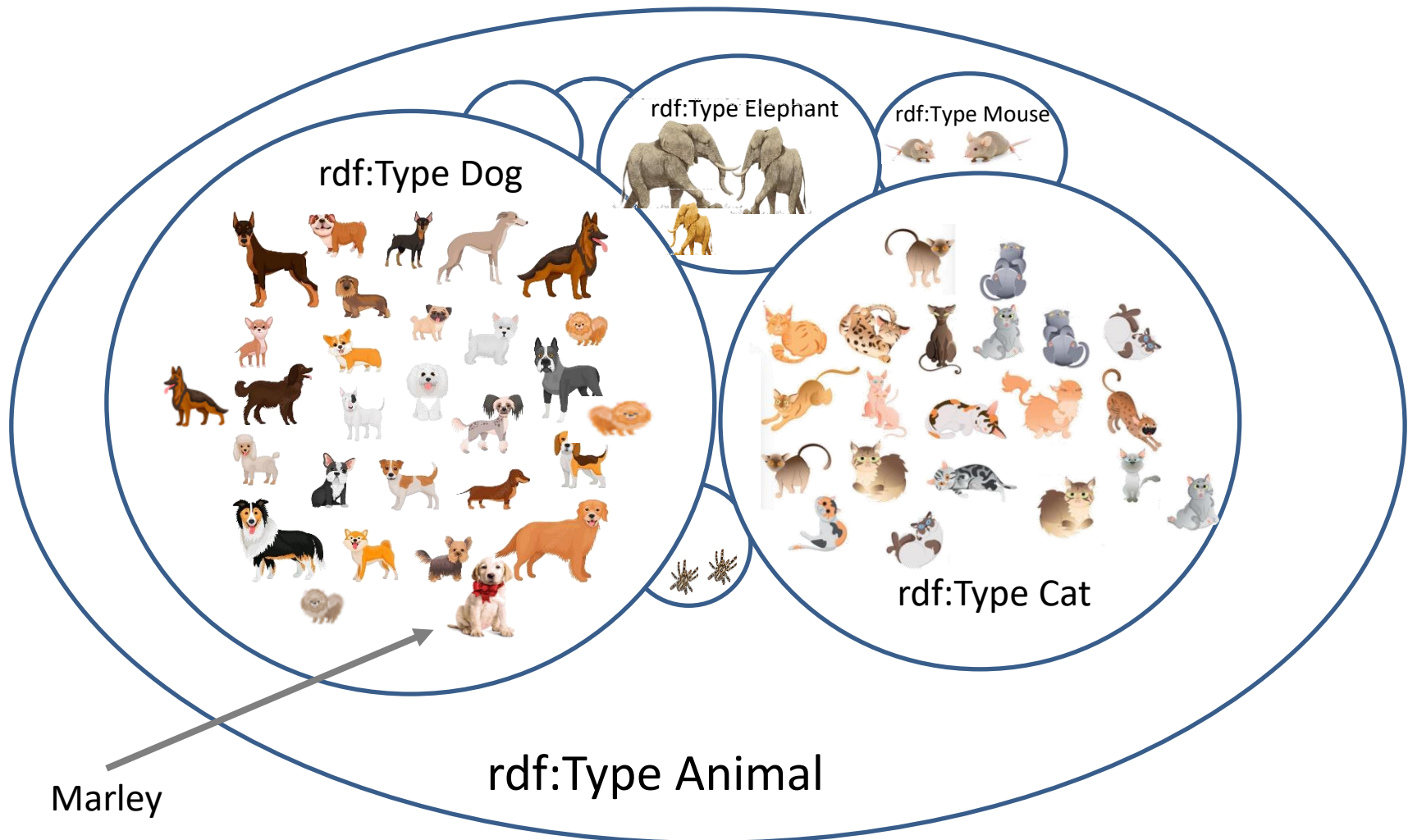


- Examples:

Subject (Resource)	Predicate (Property)	Object (Value)
<code>ex:Dog</code>	<code>rdfs:subClassOf:</code>	<code>ex:Vertebrate</code>
<code>ex:Vertebrate</code>	<code>rdfs:subClassOf:</code>	<code>ex:Animal</code>
<code>ex:Capital</code>	<code>rdfs:subClassOf:</code>	<code>ex:City</code>

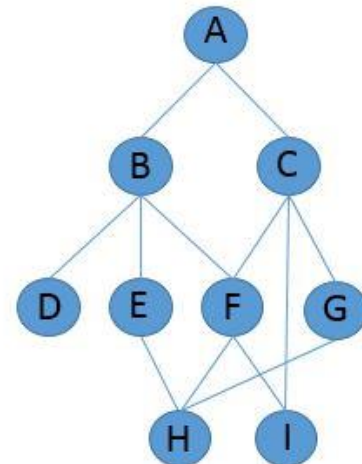
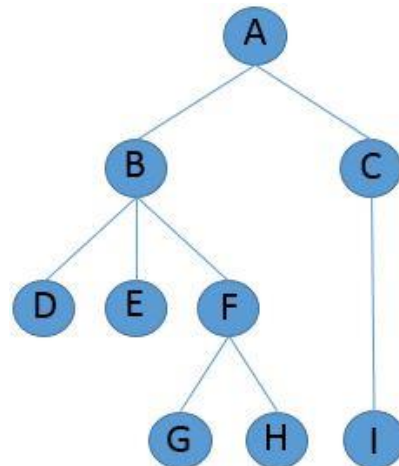
- How are instances and classes related?

# Universals / particulars subclass / instance



# Taxonomies

- if **A** is a subclass of **B** and **i** an instance de **A**, then **i** is also an instance of **B**
- If **A** is a subclass of **B** and **B** is a subclass of **C**, then **A** is a subclass of **C**
- Taxonomy



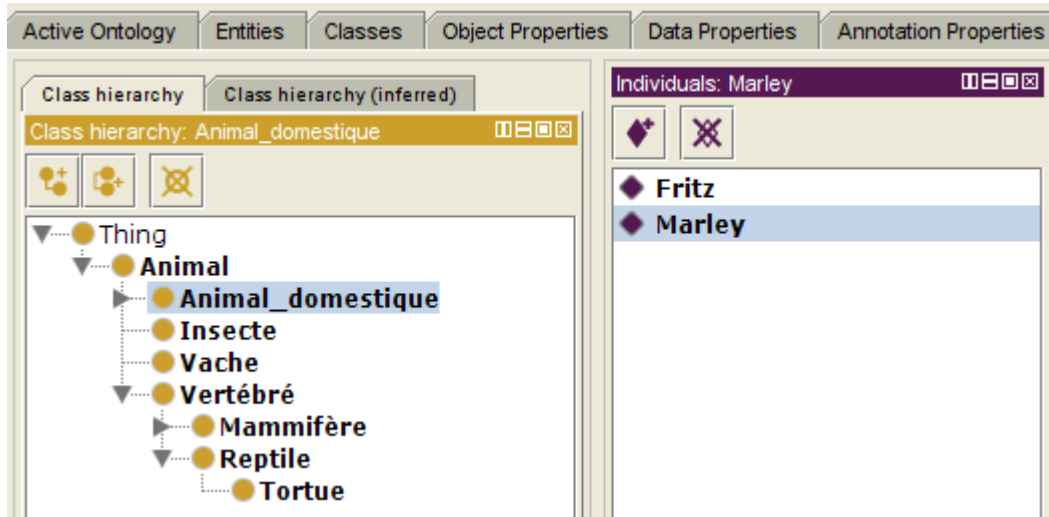
Explore:

<https://www.onezoom.org/life>

simple hierarchy / multiple hierarchy

# Let's build classes and instances in Protégé

- <https://protege.stanford.edu/>



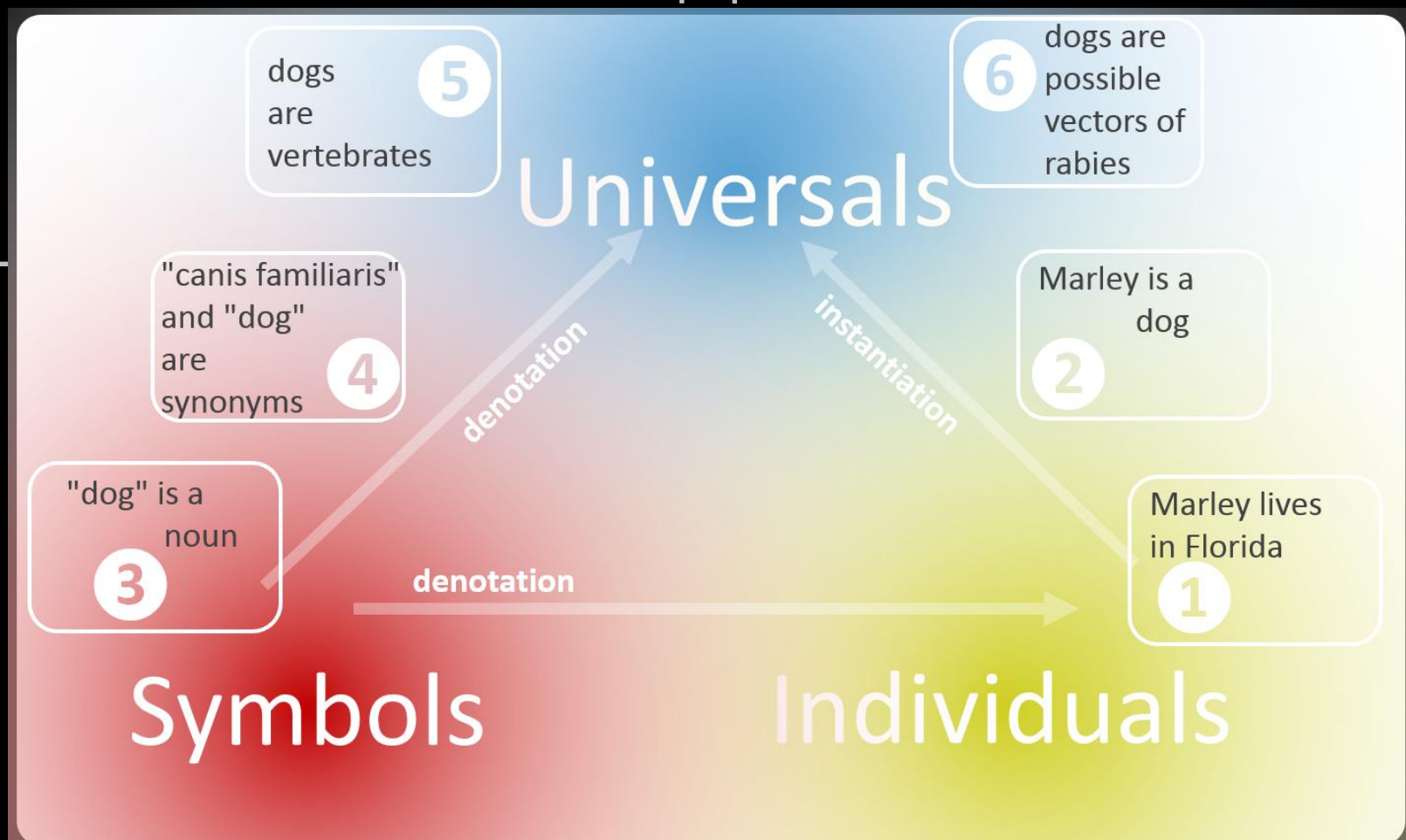
- Taxonomy (with its formal semantics): "backbone" of ontologies
- Formal ontologies: knowledge organization systems (KOS) which are based on logic and describe classes of entities of reality (objects, places, processes, qualities, ...) by the entity properties they have in common

## Ontological knowledge:

Axioms that are universally true

## Contingent knowledge:

typical, likely, possible



## Linguistic knowledge:

Statements about properties and meaning of signs of language

## Factual knowledge:

Statements about concrete entities and their relationships

"canis familiaris"  
and "dog"  
are  
synonyms

4

"dog" is a  
noun

3

denotation

denotation

# Symbols

## Linguistic knowledge:

Statements about properties and  
meaning of signs of language

# SKOS / Linked Data representations

Subject (Resource)	Predicate (Property)	Object (Value)
<code>ex:Dog</code>	<code>rdf:type</code>	<code>skos:Concept</code>
<code>ex:Dog</code>	<code>skos:prefLabel</code>	<code>"dog"@en;</code>
<code>ex:Dog</code>	<code>skos:prefLabel</code>	<code>"chien"@fr;</code>
<code>ex:Animal</code>	<code>rdf:type</code>	<code>skos:Concept</code>
<code>ex:Animal</code>	<code>skos:broader</code>	<code>ex:Dog</code>
<code>wr:dog</code>	<code>lemon:sense</code>	<code>wr:dog-English-Noun-1</code>
<code>wr:dog</code>	<code>lemon:sense</code>	<code>wr:dog-English-Verb-1</code>
<code>wr:dog-English-Noun-1</code>	<code>wt:hasPoS</code>	<code>wt:Noun</code>

Syntax TURTLE : <https://www.w3.org/TR/turtle/>

Wiktionary: <http://wiki.dbpedia.org/wiktionary-rdf-extraction>



# What matters when representing linguistic/cognitive entities?

- Different Symbols
  - Names like "Marley" or "Montreal" denote individuals
  - Terms like "dog" or "city" denote universals
- Horizontal relations between symbols:
  - Synonymy: the same symbol denotes different things
  - Homonymy: the same thing is denoted by different symbols
  - Translation: synonymy between expressions in two natural languages
  - Synonymy is often "near-synonymy"
- Vertical (hierarchical) relationships between symbols :
  - symbol A has a broader meaning than symbol B
  - Symbol B has a narrower meaning than symbol A
- Many of the relations describe grammatical and morphological features, e.g.
  - symbol A has a broader meaning than symbol B
  - Symbol B has a narrower meaning than symbol A

# Which resources describe relations?

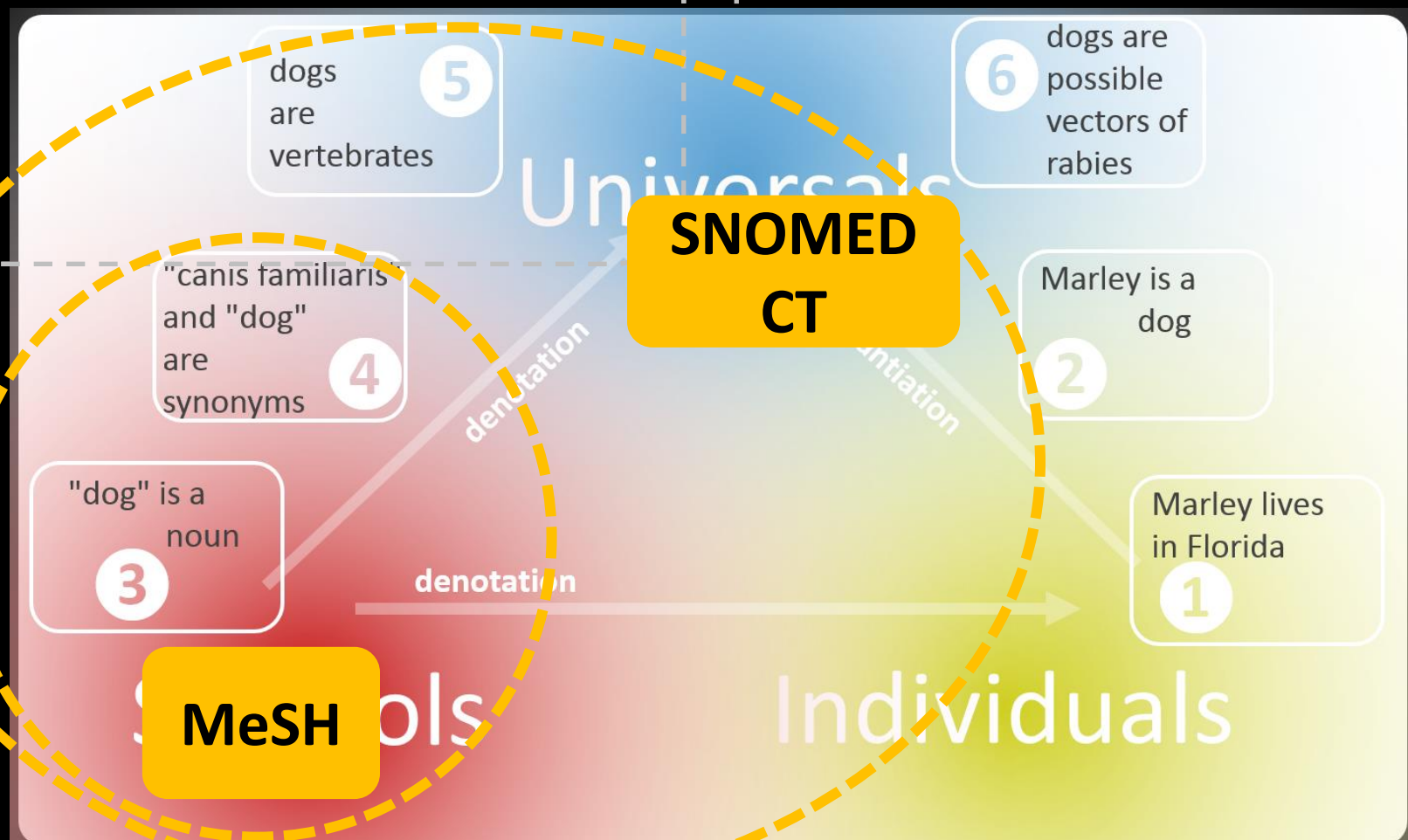
- Dictionary: contains words and terms with definitions and other characteristics (grammar, morphology, translations, synonyms)
- Hierarchical thesaurus / semantic dictionary: dictionary with richer relations, particularly with hierarchical relations (broader... narrower)
- Medical Thesaurus: MeSH (Medical Subject Headings)
- General Thesaurus of the English Language: WordNet
- Important: dictionaries and thesauri do not provision formal descriptions like ontologies.
- Comparison: SNOMED CT - MeSH

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typical, likely, possible



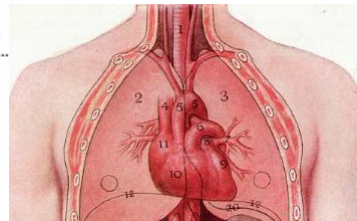
# The importance of labels



☐ Anatomic Structure, System, or Substance

☐ Organ

Heart

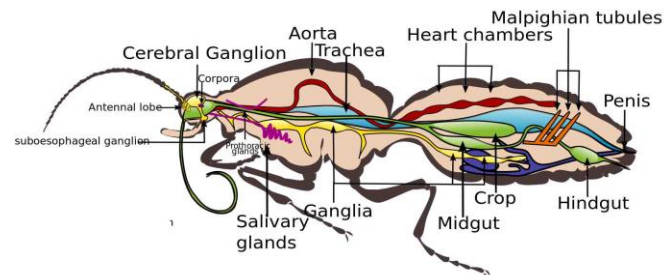


☐ anatomical entity

☐ vessel

☐ dorsal vessel

heart

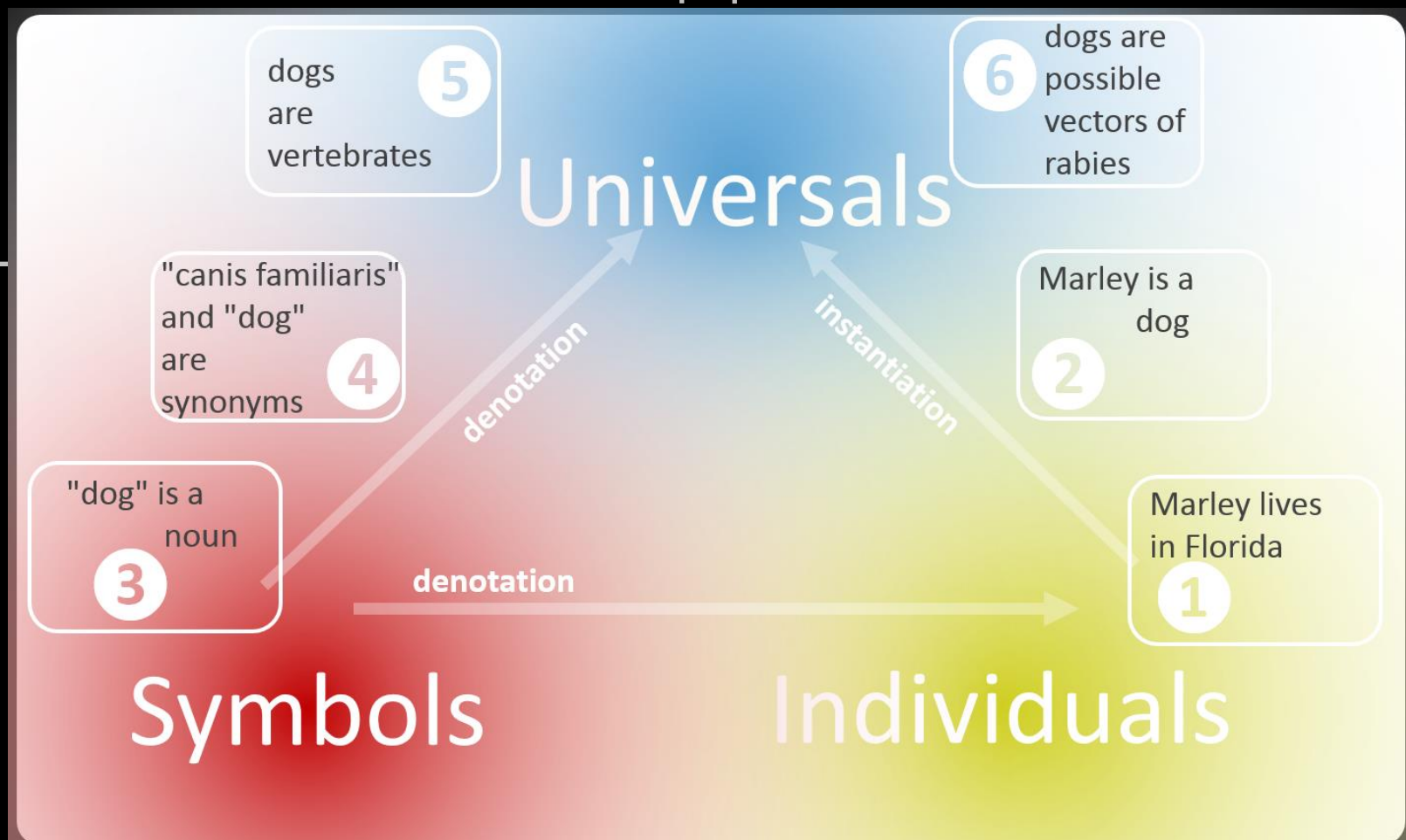


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## **Ontological knowledge:**

Axioms that are universally true

dogs  
are  
vertebrates

5

# Universals

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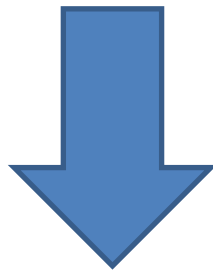
# Representation in OWL

Dog subclassOf Vertebrate

Vertebrate subclassOf Animal

Vertebra subclassOf Bone

Vertebrate equivalentTo Animal and  
has-part some Vertebra



computable inference  
(e.g. HermiT or Fact++  
OWL reasoner)

There is no dog that has no bones

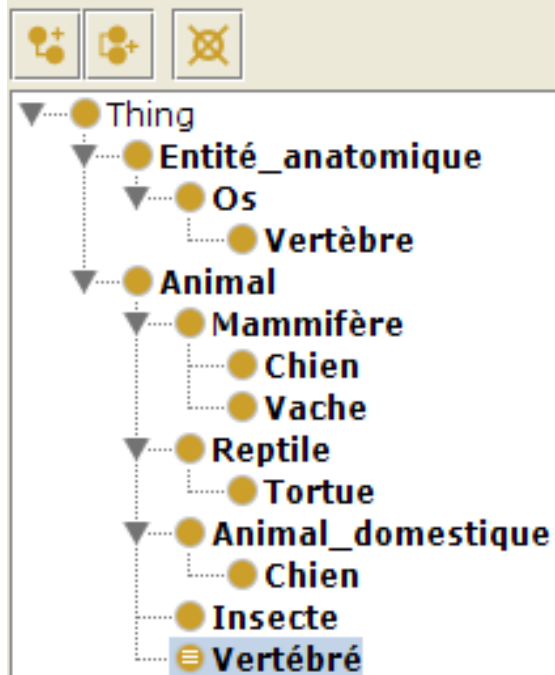
OWL Manchester Syntax: <https://www.w3.org/TR/owl2-manchester-syntax/>

HermiT reasoner: <http://www.hermit-reasoner.com/>

Fact++ reasoner: <http://owl.man.ac.uk/factplusplus/>



### Class hierarchy: Vertébré



### Annotations: Vertébré

Annotations

### Description: Vertébré

Equivalent To

**Animal** and has\_part some **Vertèbre**

SubClass Of

SubClass Of (Anonymous Ancestor)



# Characteristics of formal ontologies

- A class definition or description in an ontology always indicates what must necessarily be true for all instances of that class
- Equivalent statements:
  - All cells have a nucleus
  - There is no cell without a nucleus
- Strong restriction of what can be expressed by ontologies. However, it is the basis of logic-based reasoning

e

**Contingent knowledge:**  
typical, likely, possible

Universals

6

dogs are  
possible  
vectors of  
rabies

# Contingent knowledge

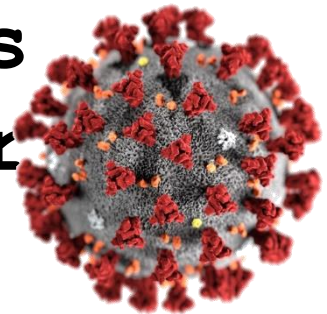
Alan Rector (2008):

" very few interesting items of knowledge that are truly ontological...". Much current work on informatics ontologies is aimed at integrating probabilistic and typical reasoning with universal "ontological" reasoning effectively. Hence, the background information for a clinical system often goes well beyond the ontology, in this strict sense. Brachman introduced the notion of the ontology as a "conceptual coat rack" on which other information is held."

# Representation of contingent knowledge with triples

- Possible, but no formal semantics!
- Complex and context-dependent interpretations

<Subject>	<Predicate>	<Object>
:Dog	:vector-of	:Rabies
:Tobacco	:causes	:Cancer
:Aspirin	:treats	:Pain
:Bird	:capable-of	:Flying
:Fever	:suggests	:Influenza



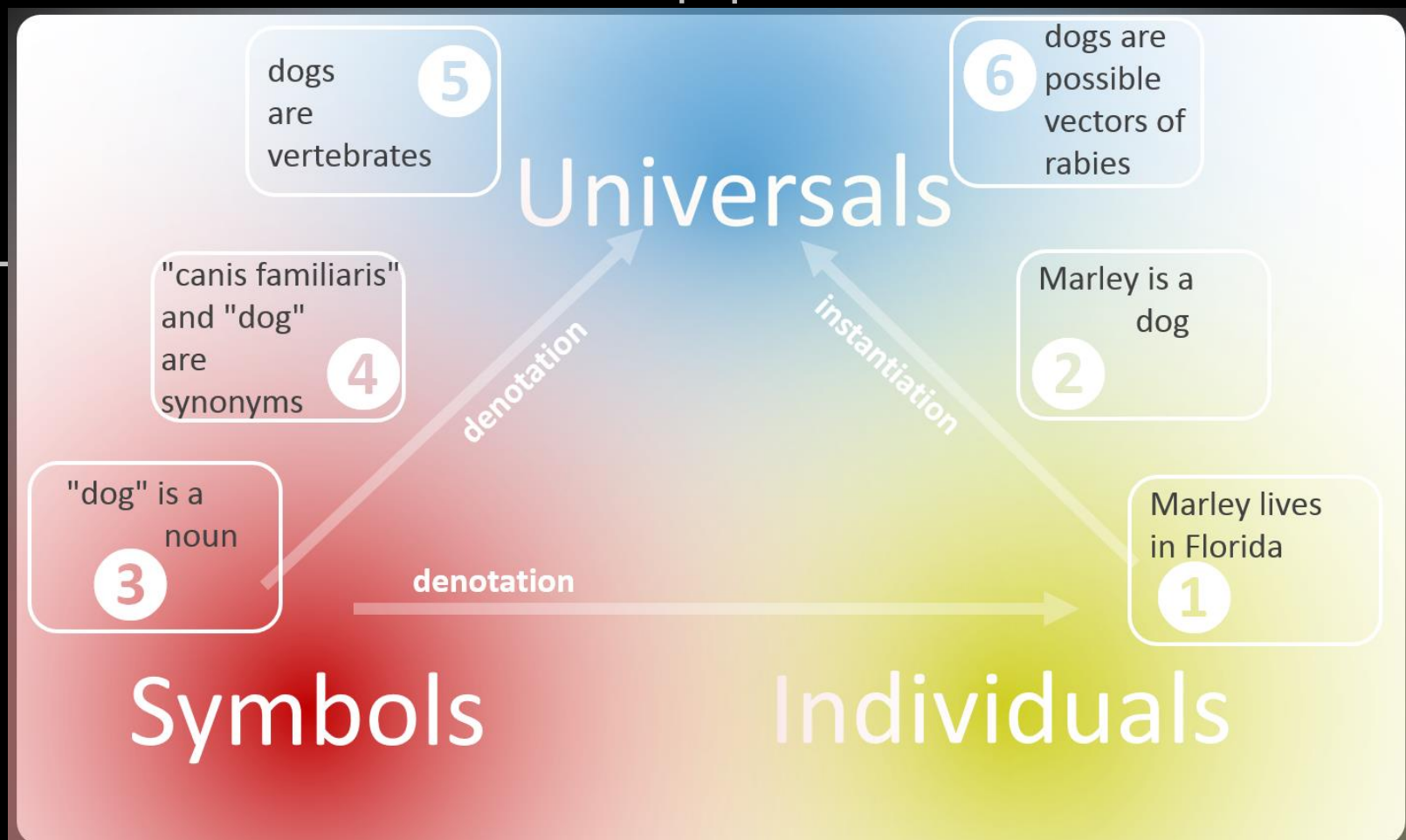
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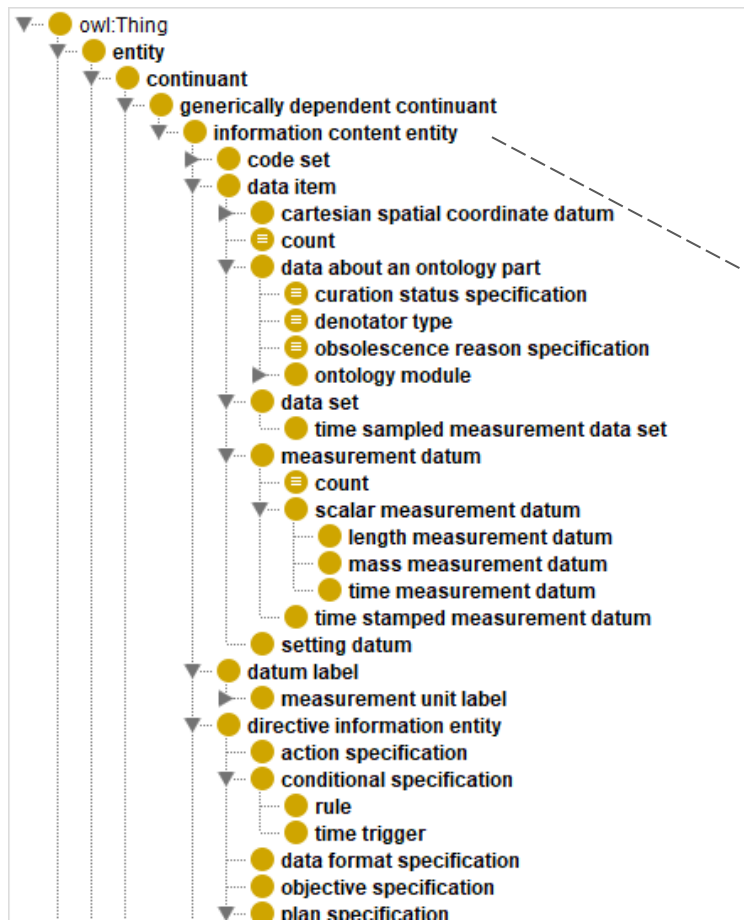
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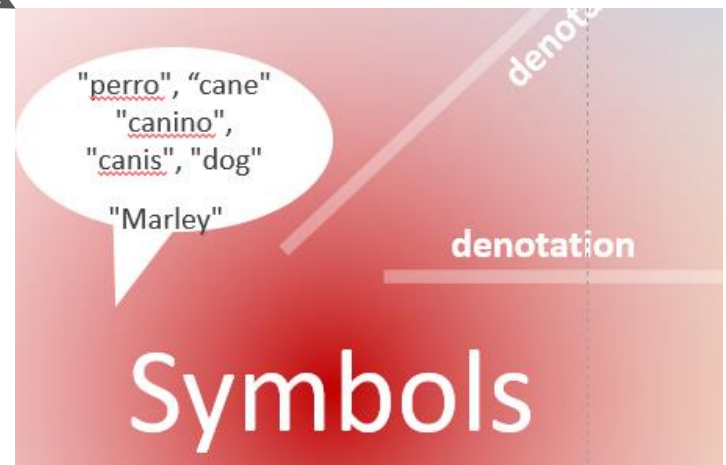
**Factual knowledge:**

Statements about concrete entities and their relationships

# Ontologies of information



- Information content entity, e.g. in IAO (information artefact ontology): „A generically dependent continuant that is about some thing”
- Ontology class for all symbolic entities

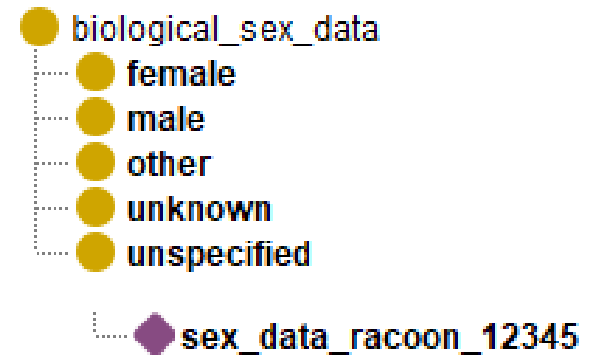
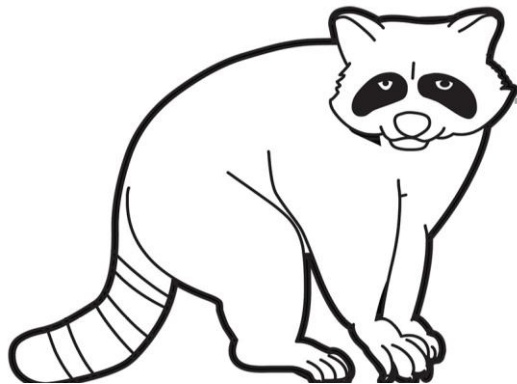




# What's the difference



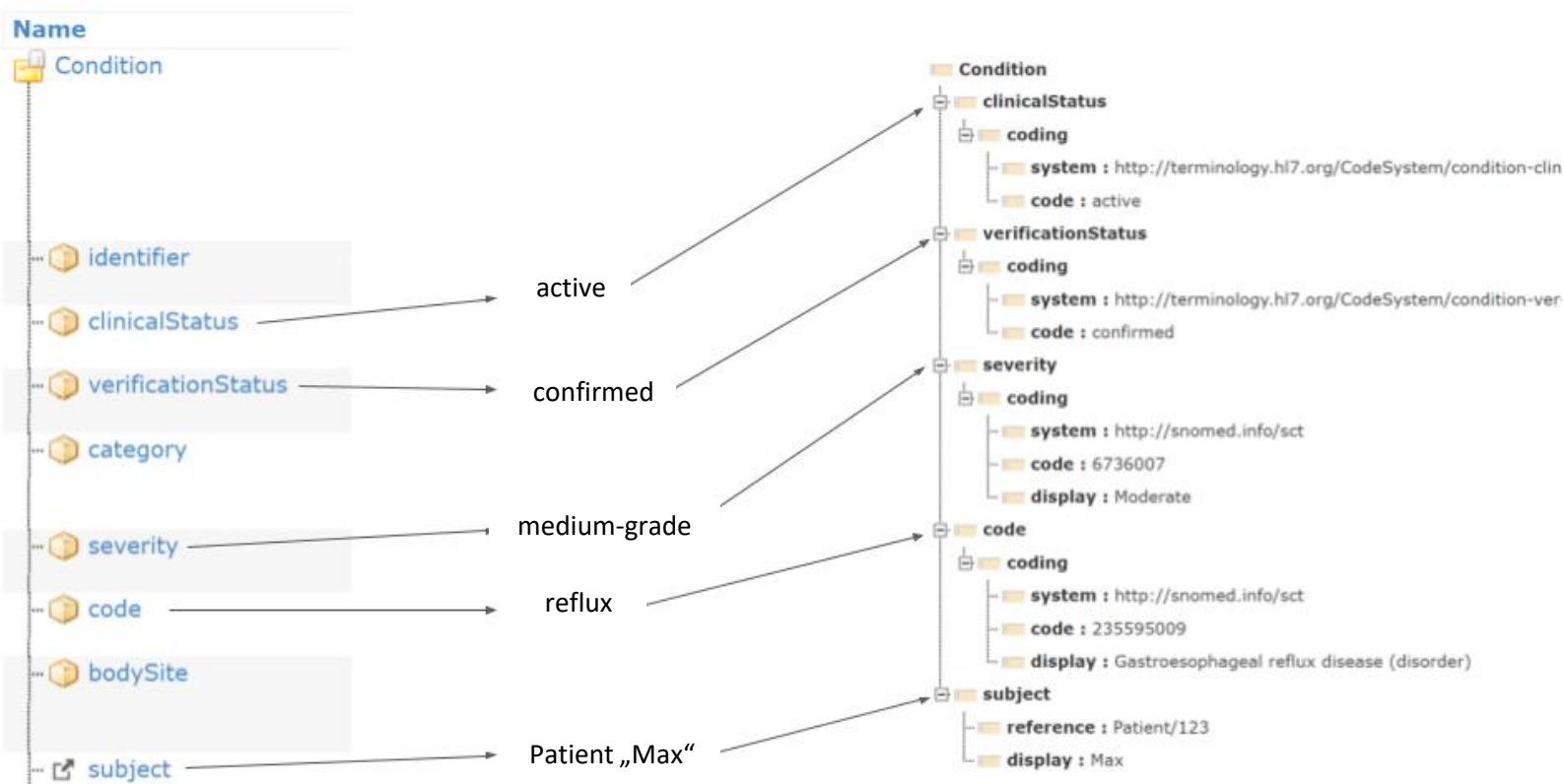
„being“ – ontology



„knowing“ – epistemology



# Example: FHIR



# OWL in a nutshell

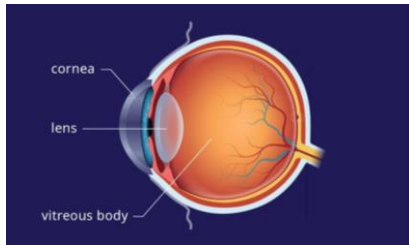
- Description logics:
  - Subset of First-Order Logics
  - Axiom-based, not graph-based (can be expressed as graphs)
  - Different syntaxes: RDF/XML, OWL/XML, **Manchester OWL**, ...
- OWL profiles
  - Different expressiveness: OWL Full > OWL DL > OWL EL
  - The more expressive, the more intractable
- OWL reasoners (Pellet, HermiT, Fact++, ELK)
  - Compute satisfiability, inferences

# OWL EL

- NExpTime-complete (good scalability)
- Constructors (**Manchester syntax**):
  - Class equivalence, subsumption, disjointness: **equivalentTo**, **subclassOf**, **DisjointClasses**  
**Primate subclassOf Animal**  
**DisjointClasses (Plant, Animal)**
  - Relationships (object properties) with algebraic properties: transitivity, reflexivity, domain / range restrictions
  - Object intersection **and** / objectSomeValuesFrom **some**  
**Vertebrate equivalentTo Animal and has-part some Vertebra**
  - Assertions about individuals (subject predicate object triples)  
**part-of(Udine, Italy)**
- Cannot express negation (only via ... **subclassOf Nothing**)

# TBox – Abox distinction

- Compare:



- Lens is part of Eye

Lens

subclass-of

part-of some Eye



Italy is part of Europe

Part-of(Italy, Europe)

# Binary relations (object properties)

- Domain (left side)
- Range (right side)
- Inverse relation
- Algebraic characteristics:
  - Transitivity:  
 $r(a, b)$   
 $r(b, c)$   
 $r(a, c)$
  - Symmetry:  
 $r(a, b) \leftrightarrow r(b, a)$
  - Reflexivity:  
 $r(a, a)$

The screenshot shows a web interface for defining a binary relation. It is divided into two main panels: 'Characteristics: is\_quality\_of' on the left and 'Description: is\_quality\_of' on the right.

**Characteristics: is\_quality\_of**

- ☐ Functional
- ☐ Inverse functional
- ☐ Transitive
- ☐ Symmetric
- ☐ Asymmetric
- ☐ Reflexive
- ☐ Irreflexive

**Description: is\_quality\_of**

- Equivalent To
- SubProperty Of
- Inverse Of   
**has\_quality**
- Domains (intersection)   
**Quality**
- Ranges (intersection)  **MaterialObject****
- Disjoint With
- SuperProperty Of (Chain)

# Upper level ontologies

- Also: foundational ontologies
- Typically provide:
  - Logical language (description logics, FOL)
  - Set of upper-level classes
  - Set of relations (object properties)
  - Constraining axioms (disjointness, domain/range restrictions)
- Purpose:
  - Facilitate domain ontology modelling
  - Supporting interoperability
  - Expressing particular point of view

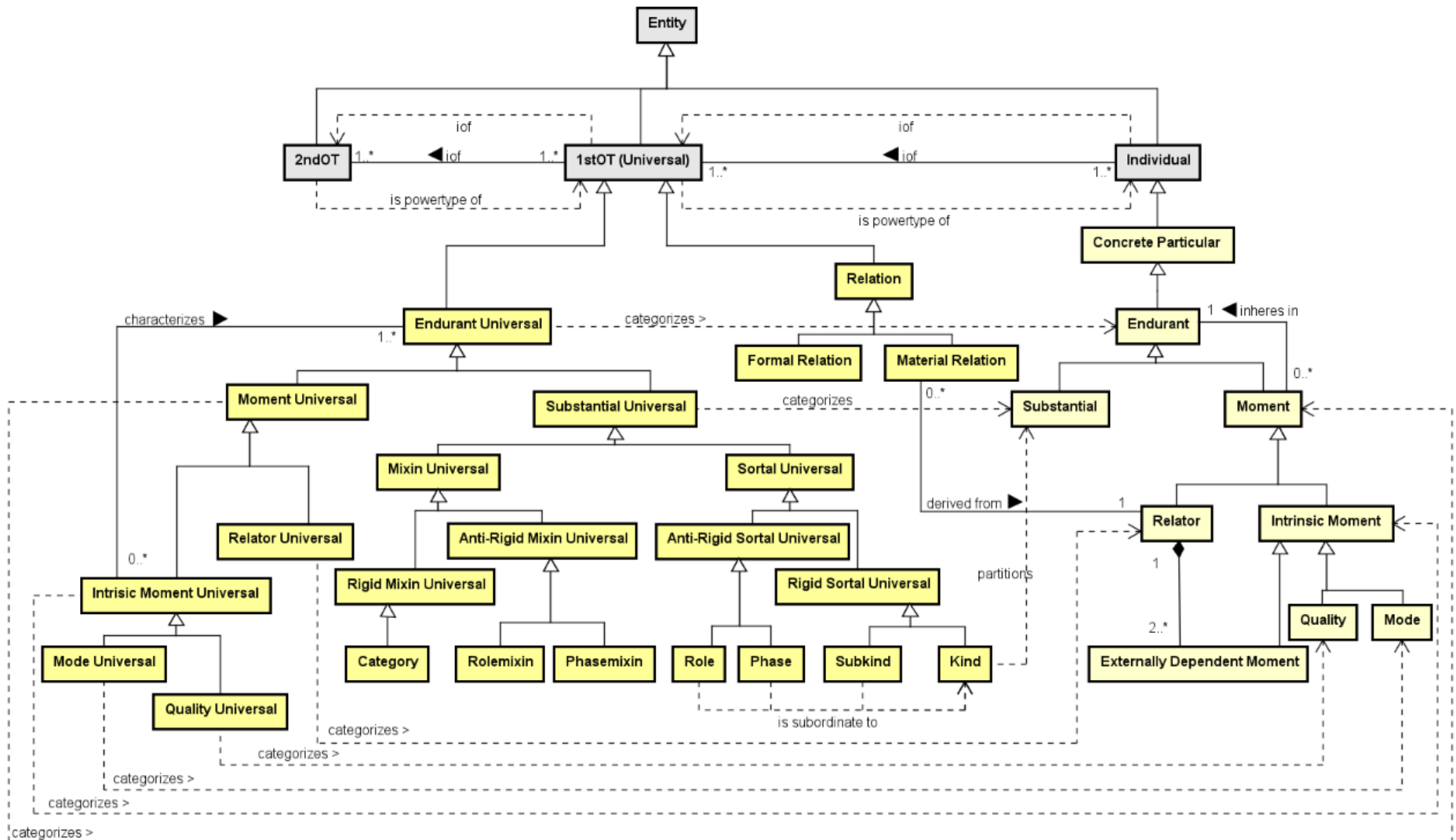
## Basic Formal Ontology



Figure created by AJH, 2022-11-24. Creative Commons Attribution-Share Alike 4.0



# Unified Formal Ontology (UFO)

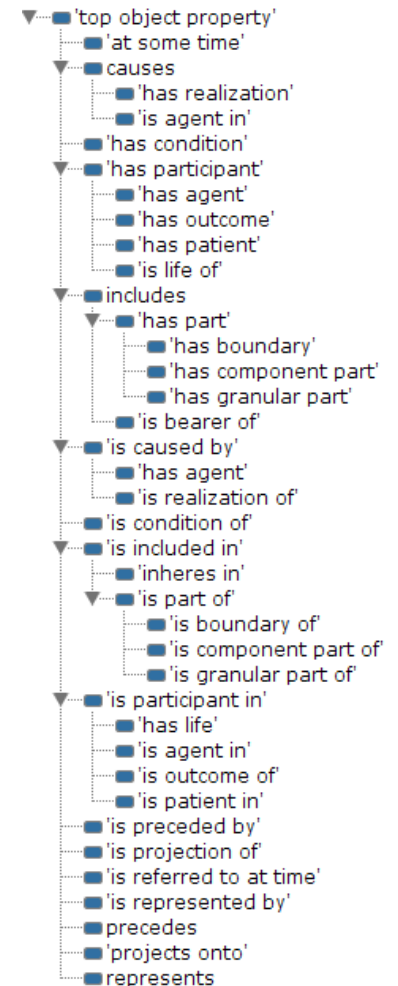
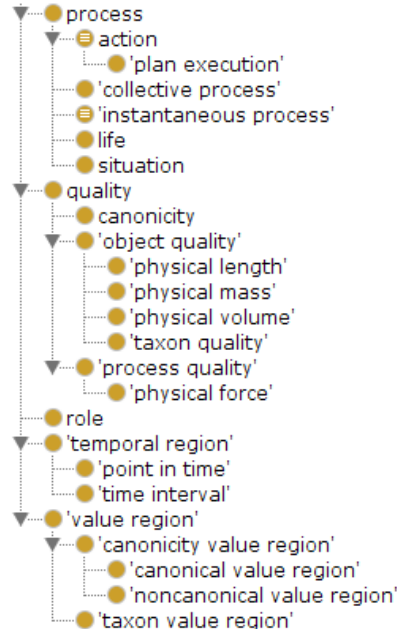
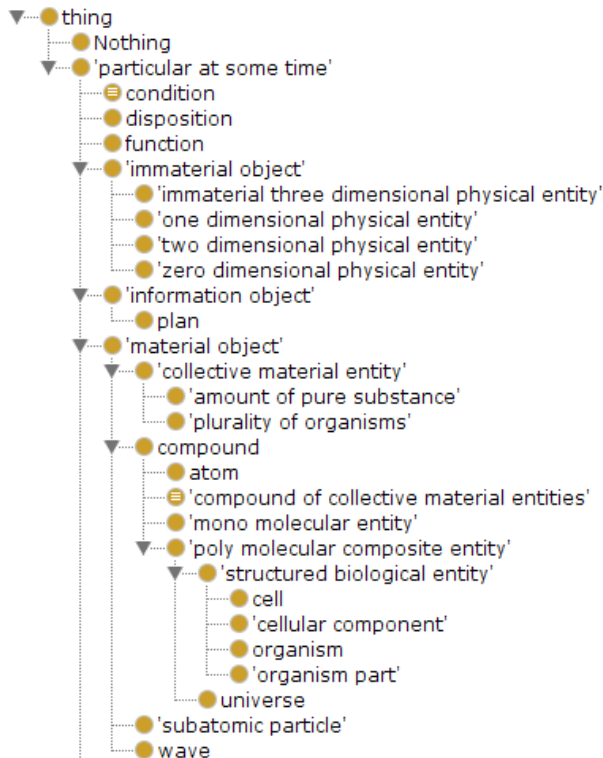


# Domain upper-level ontologies

- Examples
  - BioTop (BTL2)
  - SemanticScience integrated ontology (SIO)
  - SNOMED CT top hierarchies and concept model
- Characteristics
  - Focus on a particular domain
  - Usage does not require the „philosophical overhead“ of foundational ontologies
  - Ideally link to some foundational level ontology

# BTL2

## (BioTopLite v2)

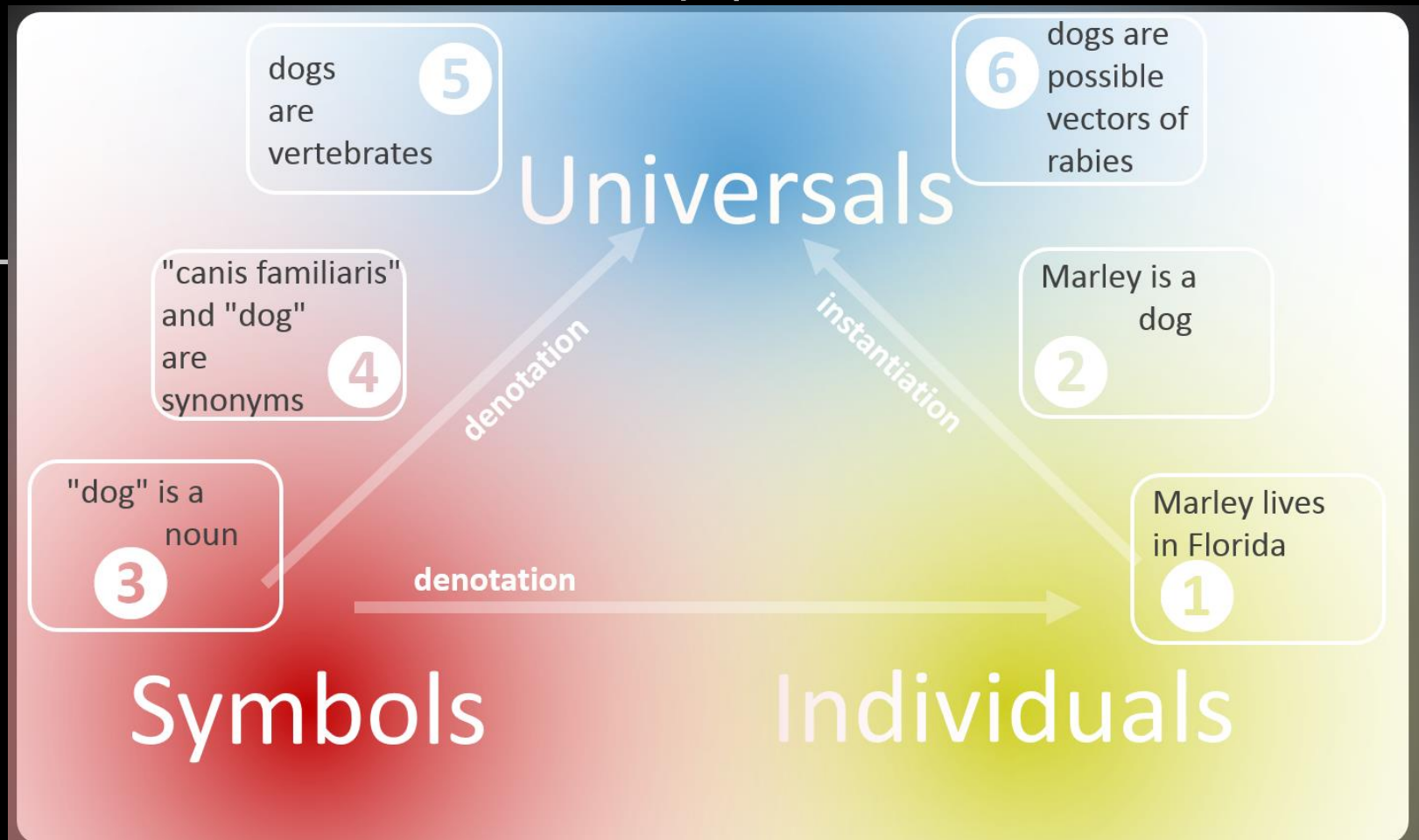


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## Ontological knowledge:

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### SUSTAINABLE KNOWLEDGE

### DYNAMIC KNOWLEDGE

Symbols

Individuals

Universals

5  
dogs  
are  
vertebrates

6  
dogs are  
possible  
vectors of  
rabies

4  
"canis familiaris"  
and "dog"  
are  
synonyms

2  
Marley is a  
dog

3  
dog  
noun

denotation

instantiation

1  
Marley lives  
in Florida

## Linguistic knowledge:

Statements about properties and  
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