Welcome to INFO216: Knowledge Graphs Spring 2023

Andreas L Opdahl <Andreas.Opdahl@uib.no>

Session 10: Formal ontologies (OWL-DL)

- Themes:
 - OWL-DL
 - core OWL concepts
 - restriction classes
 - description logic
 - decision problems



(c) Andreas L Opdahl, 2023

Readings

- Sources:
 - Allemang, Hendler & Gandon (2020):
 Semantic Web for the Working Ontologist, 3rd edition: chapters 12-13, but chapters 11-12 in the 2nd edition
 - Blumauer & Nagy (2020):
 Knowledge Graph Cookbook Recipes that Work:
 e.g., pages 105-109, 123-124, *(supplementary)*
- Resources in the wiki <http://wiki.uib.no/info216>, e.g.:
 - OWL 2 Overview (http://www.w3.org/TR/owl-overview/)
 - OWL 2 Primer (http://www.w3.org/TR/owl-primer/):
 - show: Turtle and Manchester syntax
 - hide: other syntaxes



THE KNOWLEDGE GRAPH		
COO	KBC	ОК
RECIPES	THAT	WORK



AND HELMUT NAGY



INFO216: Knowledge Graphs

The Core OWL Concepts

Web Ontology Language versions

- OWL "1" (2002):
 - OWL Full anything goes
 - OWL DL fragment of OWL Full, formal semantics through *description logic*
 - OWL Lite simple fragment of OWL DL, not much used
- OWL 2 (2008):
 - backwards compatible with OWL "1"!
 - OWL2 DL fragment of OWL2 full, extension of OWL DL
 - formal and powerful, but *reasoning can get prohibitively slow*
 - OWL2 DL defines three faster fragments of OWL2 DL:
 - OWL2 RL rule-based semantics, also OWL LD for Linked Data
 - OWL2 EL quick DL reasoning
 - OWL2 QL suitable for query rewriting



(c) Andreas L Opdahl, 2023

Classes, properties, and individuals (\leftarrow S08)

- Web Ontology Language (OWL):
 - builds on RDF and RDFS
 - uses classes and properties from RDF and RDFS
 - adds precision and formality
- Basic OWL-concepts:
 - owl:Thing (equivalent to rdfs:Resource)
 - owl:Class (equivalent to rdfs:Class)
 - owl:ObjectProperty (equivalent to rdf:Property)
 - owl:NamedIndividual (things with URIs and that are not classes)
- Good practice: keep Classes, Individuals, and Properties disjoint, i.e., no resource has more than one of them as rdf:type
 - in OWL DL, this is mandatory...



INFO216: Knowledge Graphs



http://www.w3.org/TR/owl2-rdf-based-semantics/

Building blocks

- OWL 2 has three building blocks:
 - entities:
 - refer to real-world entities using URIs
 - owl:NamedClass, owl:NamedIndividual

OWL2 can be seen as an extension of RDF and RDFS, but can also stand on its own feet.

- owl:ObjectProperty, owl:DatatypeProperty, owl:AnnotationProperty, owl:ObjectProperty
- axioms:

← can be true or false!

- basic statements expressed by the OWL ontology
- every triple in the RDF graph is an axiom
- expressions:
 - use constructors to
 - define more complex entities
 - by *combining* simpler ones

(c) Andreas L Opdahl, 2023



More building blocks

- owl:Thing:
 - is equivalent to rdfs:Resource
 - logic interpretation: True
 - called the *top concept* in description logic (DL)
- owl:Nothing
 - is the empty set
 - no resource has it as its *rdf:type*
 - logic interpretation: False
 - called the bottom concept in DL



(c) Andreas L Opdahl, 2023

Named and constructed classes

- owl:NamedClass (with an URI):
 - semantics are given by:
 - URI-s, labels and other annotations
 - domain, range, subClassOf and other relationships
- *Constructed* (or *complex*) owl:Class:
 - built from existing classes, properties, individuals
 - which can be named *or anonymous*
 - constructed classes are anonymous upon declaration,
 - but can be named later
 - unions, intersections and negations of existing classes (←S08)
 - enumeration of existing individuals (←S08)
 - restrictions on existing properties



INFO216: Knowledge Graphs

Object and datatype properties

- In RDF triples, the object is either a resource or a literal
 - OWL has two corresponding types of properties
 - owl:ObjectProperty:
 - rdfs:range ("verdiområde") is usually an OWL-class of individuals
 - used in axioms (e.g., RDF triples) with a *resource* object
 - owl:DatatypeProperty:
 - rdfs:range is an RDFS-datatype
 - used in axioms (e.g., RDF triples) with a *literal* object
 - the rdfs:domain ("definisjonsmengden") is always an OWL-class of individuals

Formally, owl:DatatypeProperty is rdfs:subPropertyOf owl:ObjectProperty .



(c) Andreas L Opdahl, 2023

Summary: core OWL concepts

- owl:Thing, owl:Nothing owl:NamedIndividual
- owl:NamedClass, owl:Class
- owl:ObjectProperty, owl:DatatypeProperty
- owl:AnnotationProperty, owl:OntologyProperty



(c) Andreas L Opdahl, 2023

Summary: more precise properties (\leftarrow S08)

- owl:inverseOf
- owl:SymmetricProperty, owl:AsymmetricProperty
- owl:ReflexiveProperty, owl:IrreflexiveProperty
- owl:TransitiveProperty
- owl:FunctionalProperty, owl:InverseFunctionalProperty
- owl:hasKey
- Also:
 - negated properties
 - chained properties, e.g.: fam:hasGrandparent owl:propertyChainAxiom (:hasParent :hasParent).



INFO216: Knowledge Graphs

Summary: sameness and difference (←S08)

- Individuals:
 - pairwise: owl:sameAs, owl:differentFrom
 - groupwise difference: owl:AllDifferent
- Classes:
 - pairwise: owl:equivalentClass, owl:disjointWith
 - groupwise difference: owl:AllDisjointClasses
- Properties:
 - pairwise: equivalentProperty, propertyDisjointWith
 - groupwise difference: owl:AllDisjointProperties
- Membership in the groups:
 - owl:distinctMembers (preferred) or owl:members



INFO216: Knowledge Graphs

Summary: complex classes (←S08)

- owl:oneOf
- owl:unionOf
- owl:intersectionOf
- owl:complementOf (and the CWA)
- owl:NegativePropertyAssertion, owl:sourceIndividual, owl:assertionProperty, owl:targetIndividual



INFO216: Knowledge Graphs

OWL restriction classes

Property value restrictions

- Defining a class by a particular value on one of its properties, e.g.:
 - ex:Republican

a owl:Restriction ; owl:onProperty dbo:hasParty ; owl:hasValue dbr:Republican_Party_(United_States) .



INFO216: Knowledge Graphs

Property value restrictions

- Defining a class by a particular value on one of its properties, e.g.:
 - ex:Republican owl:intersectionOf (
 - dbr:Person
 - [a owl:Restriction ;
 - owl:onProperty dbo:hasParty;
 - owl:hasValue dbr:Republican_Party_(United_States)



Existential property restrictions

- Defining a class by the existence of a relation (object property) to an individual in (another or the same) class, e.g.:
 - ex:President owl:intersectionOf (

dbr:Person

- [a owl:Restriction ; owl:onProperty ex:presidentOf ; owl:someValuesFrom owl:Thing
]
- owl:someValuesFrom: each individual in the defined class has at least one object property (given by owl:onProperty) to an individual in the other class (given by owl:someValuesFrom)



INFO216: Knowledge Graphs

Existential property restrictions

- Defining a class by the existence of a relation (object property) to an individual in (another or the same) class, e.g.:
 - ex:US_President owl:intersectionOf (

dbr:Person

a owl:Restriction ;

owl:onProperty ex:presidentOf;

owl:someValuesFrom dbr:UnitedStates

 owl:someValuesFrom: each individual in the defined class has at least one object property (given by owl:onProperty) to an individual in the other class (given by owl:someValuesFrom)



INFO216: Knowledge Graphs

Universal property restrictions

- Defining a class by the necessity of a relation (object property) only to individuals in (another or the same) class, e.g.:
 - ex:LoyalRepublican owl:intersectionOf (
 - dbr:Person
 - [a owl:Restriction ;
 - owl:onProperty dbr:hasParty ;
 - owl:allValuesFrom dbr:Republican_Party_(United_States)



Universal property restrictions

- Defining a class by the necessity of a relation (object property) only to individuals in (another or the same) class, e.g.:
 - ex:LoyalRepublican owl:intersectionOf (
 - dbr:Person
 - [a owl:Restriction ;
 - owl:onProperty dbr:hasParty ;
 - owl:allValuesFrom dbr:Republican_Party_(United_States)





INFO216: Knowledge Graphs

(c) Andreas L Opdahl, 2023

).

Universal property restrictions

- Defining a class by the necessity of a relation (object property) only to individuals in (another or the same) class, e.g.:
 - ex:LoyalRepublican owl:intersectionOf (
 - dbr:Person
 - a owl:Restriction ;

owl:onProperty dbr:hasParty ;
owl:allValuesFrom dbr:Republican_Party_(United_States)

a owl:Restriction ; owl:onProperty dbr:hasParty ;

owl:someValuesFrom owl:Thing



Property self-reflexion

- Defining a class by a *Self* value on one of its properties, e.g.:
 - ex:Narcissist

a owl:Restriction ; owl:onProperty ex:loves ; owl:hasSelf "true"^^xsd:boolean .



(c) Andreas L Opdahl, 2023

Datatype property restriction

- Restrictions on data range, e.g.:
 - fam:personAge rdfs:range
 - [a rdfs:Datatype;

owl:onDatatype xsd:integer;

owl:withRestrictions (

[xsd:minInclusive "0"^^xsd:integer]

[xsd:maxInclusive "130"^^xsd:integer])

- :toddlerAge rdfs:range

].

[a rdfs:Datatype;

owl:oneOf ("1"^^xsd:integer "2"^^xsd:integer)



(c) Andreas L Opdahl, 2023

Cardinality restriction

- Defining a class by the number of object values its individuals have for some property, e.g.:
 - music:Quartet owl:intersectionOf (

music:Ensemble

- [a owl:Restriction ; owl:onProperty music:hasInstrument ; owl:cardinality 4]
- owl:cardinality gives the *exact cardinality* owl:minCardinality gives the *least cardinality* owl:maxCardinality gives the *greatest cardinality*



INFO216: Knowledge Graphs

Qualified cardinality restriction

- Defining a class by the number of object values its individuals have of a given class for some property, e.g.:
 - pol:Triumvirate owl:intersectionOf (

pol:PoliticalLeadership

a owl:Restriction ; owl:onProperty pol:hasMember ;

owl:qualifiedCardinality 3 ; owl:onClass pol:PoliticalLeader

 owl:qualifiedCardinality gives the exact cardinality owl:minQualifiedCardinality gives the least cardinality owl:maxQualifiedCardinality gives the greatest cardinality



(c) Andreas L Opdahl, 2023

Qualified cardinality restriction

- music:StringQuartet owl:intersectionOf (
 music:MusicalQuartet
 - [a owl:Class ;

owl:onProperty music:hasInstrument ; owl:qualifiedCardinality "2" ; owl:onClass music:Violin]

[a owl:Class ;

owl:onProperty music:hasInstrument ; owl:qualifiedCardinality "1" ; owl:onClass music:Viola]

a owl:Class ;

owl:onProperty music:hasInstrument ;
owl:qualifiedCardinality "1" ;
owl:onClass music:Cello]).



Summary: property restrictions

- owl:Restriction owl:onProperty
- owl:someValuesFrom, owl:allValuesFrom, owl:hasValue
- owl:cardinality, owl:minCardinality, owl:maxCardinality
- owl:qualifiedCardinality, owl:minQualifiedCardinality, owl:maxQualifiedCardinality, owl:onClass



(c) Andreas L Opdahl, 2023

Description logic



Relation to OWL

- OWL DL and description logic are closely matched
 - everything in OWL DL has a DL-counterpart
 - almost everything in DL can be expressed in OWL DL
- DL is a family of logic systems:
 - some of them correspond to particular OWL profiles (more later)
 - OWL1 DL: $SHO9N^{(D)}$
 - OWL2 DL: SR090(0)



INFO216: Knowledge Graphs

Description logic and other logics

- *Proposition logics are about statements (propositions):*
 - "Robin is a StudentAssistant" \(\Lambda\) "Robin is a Student" \(\Lambda\)"Robin is a Teacher"
- (First order) *predicate logics* are about *predicates* and *objects*:
 - $\forall x.(StudentAssistant(x) \Leftrightarrow Student(x) \land Teacher(x))$
- *Description logics* are about *concepts*:
 - StudentAssistant = Student 🗆 Teacher
 - ...and also about roles and individuals



(c) Andreas L Opdahl, 2023

Description logics

- Description Logic (DL)
 - a simple *fragment* of predicate logic
 - ...or, rather, a *family of such fragments*
 - not very expressive ("uttrykkskraftig")
 - but can answers many *decision problems* (rather) quickly
- Suitable for describing *concepts* ("begreper")
 - formal basis for OWL DL
 - can be used to:
 - describe concepts ("Tbox") and their roles ("Rbox")
 - describe *individuals* and their relations ("ABox")



(c) Andreas L Opdahl, 2023

Definition of concepts ("begreper")

- InternalCensor = Censor \sqcap Employee
- ExternalCensor = Censor \neg Employee
- Agent \doteq Person \sqcup Organisation \sqcup Group
 - concepts: InternalCensor, Censor, Employee ...
 - definition: =
 - conjunction (and): \Box
 - disjunction (or): □
 - negation (not): -
 - nested expressions: ()
- Childless = ...using Human and Parent..



INFO216: Knowledge Graphs

Definition of concepts ("begreper")

- InternalCensor = Censor \sqcap Employee
- ExternalCensor = Censor \neg Employee
- Agent \doteq Person \sqcup Organisation \sqcup Group
 - concepts: InternalCensor, Censor, Employee ...
 - definition: =
 - conjunction (and): \Box
 - disjunction (or): □
 - negation (not): -
 - nested expressions: ()
- Childless = Human $\sqcap \neg$ Parent



INFO216: Knowledge Graphs

Types of concepts ("begreper")

- InternalCensor = Censor \sqcap Employee
- ExternalCensor = Censor \neg Employee
- Agent \doteq Person \sqcup Organisation \sqcup Group
 - atomic (or basic, primitive) concepts: Censor, Employee, Person...
 - only used on the r.h.s. of definitions
 - concept expressions (complex concepts):
 Censor □ Employee, ¬ Employee...
 - only used on the r.h.s. of definitions
 - defined (and named) concepts:

InternalCensor, ExternalCensor, Agent...

- defined on the *l.h.s. (left-hand side)* of definitions



(c) Andreas L Opdahl, 2023

Atomic, complex and defined concepts

- Atomic (or basic) concepts
 - given, always named
 - can only be used on the r.h.s. (right-hand side) of a \doteq definition
 - correspond to simple OWL classes
- Concept expressions
 - expressed using other concepts (and roles)
 - can only be used on the r.h.s. (right-hand side) of a \doteq definition
 - correspond to complex OWL classes
- Defined concepts can also be named
 - must appear on the l.h.s. (right-hand side) of a \doteq definition
 - concept_name ÷ concept_expression
- ...similar distinction between atomic and defined roles



INFO216: Knowledge Graphs

• President \doteq Person $\sqcap \exists$ presidentOf. \top

An atomic (or basic) role

- Independent ≐ Person □ ¬∃hasParty.⊤
- USPresident = Person $\sqcap \exists presidentOf.UnitedStates$
 - roles: presidentOf, hasParty...
 - universal concept ("top"): T
 - -existential restriction: \exists
- Grandparent = ...using Human, hasChild, Parent..
- Grandparent = ...using only Human, hasChild..
- Uncle = ...using Male, hasSibling, hasChild..



INFO216: Knowledge Graphs

- President \doteq Person \sqcap \exists presidentOf. \top
- Independent \doteq Person $\neg \exists$ hasParty. \top
- USPresident = Person $\sqcap \exists presidentOf.UnitedStates$
 - roles: presidentOf, hasParty...
 - universal concept ("top"): T
 - -existential restriction: \exists
- Grandparent = Human $\sqcap \exists$ hasChild.Parent
- Grandparent = ...using only Human, hasChild..
- Uncle = ...using Male, hasSibling, hasChild..



INFO216: Knowledge Graphs

- President \doteq Person \sqcap \exists presidentOf. \top
- Independent \doteq Person $\neg \exists$ hasParty. \top
- USPresident = Person $\sqcap \exists presidentOf.UnitedStates$
 - roles: presidentOf, hasParty...
 - universal concept ("top"): T
 - -existential restriction: \exists
- Grandparent = Human $\sqcap \exists$ hasChild.Parent
- Grandparent \doteq Human $\sqcap \exists$ hasChild. \exists hasChild. \top
- Uncle =using Male, hasSibling, hasChild....



INFO216: Knowledge Graphs

- President \doteq Person \sqcap \exists presidentOf. \top
- Independent \doteq Person $\neg \exists$ hasParty. \top
- USPresident = Person $\sqcap \exists presidentOf.UnitedStates$
 - roles: presidentOf, hasParty...
 - universal concept ("top"): T
 - -existential restriction: \exists
- Grandparent = Human $\sqcap \exists$ hasChild.Parent
- Grandparent \doteq Human $\sqcap \exists$ hasChild. \exists hasChild. \lnot
- Uncle \doteq Male \sqcap \exists hasSibling. \exists hasChild. \top



INFO216: Knowledge Graphs

Null concept

- Person \sqcap Group $\sqsubseteq \bot$
 - null concept ("bottom"): \bot
 - subsumption (sub concept): \Box
- \sqsubseteq is used for subsumption axioms
 - or: containment / specialisation axioms
- \doteq is used for *definitions* (or just \equiv)
 - ≡ is also used for *equivalence axioms*
- Note the use of . . . ⊑ ⊥ ("subsumption of bottom") to say that *something is not the case*



INFO216: Knowledge Graphs

Null concept

- Person \sqcap Group $\sqsubseteq \bot$
 - null concept ("bottom"): \bot
 - subsumption (sub concept): \Box
- \sqsubseteq is used for subsumption axioms
 - or: containment / specialisation axioms
- \doteq is used for *definitions* (or just \equiv)
 - = is also used for equivalence axioms
- Note the use of ... ⊑ ⊥ ("subsumption of bottom") to say that something is not the case
- This is a DL axiom
 - so far we have just *defined* concepts



INFO216: Knowledge Graphs

Axioms

- = is used for *definitions* of new concepts
- = is used for *equivalence axioms* about concepts
 - ...but some authors used it for definitions too :-/
- Axioms are equivalences or subsumptions:
 - *subsumption* axioms (\Box):
 - composite concept (role) expressions on both sides
 - equivalence axioms (\equiv):
 - composite concept (role) expressions on both sides
 - corresponds to: $\mathbf{C} \sqsubseteq \mathbf{D}, \mathbf{D} \sqsubseteq \mathbf{C}$



INFO216: Knowledge Graphs

More role definitions

- LoyalRepublican = Republican $\sqcap \forall hasParty.Republican$
 - universal restriction: \forall
- Monotheist \doteq =1 believesInDeity. \top
- Polygamist = ≥3 hasSpouse.⊤
 - number restrictions: =, \geq , \leq
- Narcissist = ∃hasLoveFor.<u>Self</u>
 - self references: <u>Self</u>
- MassMurderer = ...using hasKilled, Human...



(c) Andreas L Opdahl, 2023

More uses of roles

- LoyalRepublican = Republican $\sqcap \forall hasParty.Republican$
 - universal restriction: \forall
- Monotheist \doteq =1 believesInDeity. \top
- Polygamist = ≥3 hasSpouse.⊤
 - number restrictions: =, \geq , \leq
- Narsissist = ∃hasLoveFor.<u>Self</u>
 - self references: <u>Self</u>
- MassMurderer ≐ ≥4 hasKilled.Human



INFO216: Knowledge Graphs

Inverse and transitive roles

- StrayDog \doteq Dog $\sqcap \neg \exists$ hasOwner⁻. \top
- hasParent = hasChild⁻
- PureBred = $\forall hasParent^*$.PureBred
 - inverse role: hasChild
 - transitive role: hasParent*
- Niece = ...Woman, hasChild, hasSibling..



INFO216: Knowledge Graphs

Inverse and transitive roles

- StrayDog ≐ Dog □ ¬∃hasOwner⁻.⊤
- hasParent = hasChild⁻
- PureBred = $\forall hasParent^*$.PureBred
 - inverse role: hasChild⁻
 - transitive role: hasParent*
- Niece \doteq Woman $\sqcap \exists$ hasChild⁻.hasSibling. \top
- We just define a role!
 - until now, we have only defined *concepts*



INFO216: Knowledge Graphs

Composite roles

- Similar to composite concepts, e.g.:
 - holdsPresidency = hasParty o presidentOf
 - hasLovedChild = hasChild \sqcap hasLoveFor
 - hasBrother = (hasSibling | Male)
- Not all supported by OWL-DL and the reasoning engines
 - they can have "bad decision problems"
 - i.e., they compute slowly or intractably
 - ...with some exceptions
- **hasDaughter** \doteq ...using hasChild, Female..



INFO216: Knowledge Graphs

Composite roles

- Similar to composite concepts, e.g.:
 - holdsPresidency \equiv hasParty o presidentOf
 - hasLovedChild = hasChild \sqcap hasLoveFor
 - hasBrother = (hasSibling | Male)
- Not all supported by OWL-DL and the reasoning engines
 - they can have "bad decision problems"
 - i.e., they compute slowly or intractably
 - ...with some exceptions
- hasDaughter = (hasChild | Female)



INFO216: Knowledge Graphs

Putting it together

- Source [±] ∃ hasSource⁻.Content
- VerifiedContent $\doteq \exists$ verifiedBy.FactChecker
- DebunkedContent $\doteq \exists$ debunkedBy.FactChecker
- UnreliableSource $\doteq \exists$ hasSource⁻.DebunkedContent
- VerifyingSource $\doteq \exists$ hasSource⁻.VerifiedContent
 - $\sqcap \forall hasSource^-.VerifiedContent$

An *acyclic*, *definitional* TBox



(c) Andreas L Opdahl, 2023

Putting it together

- Source \doteq
- TrustedContent =
- VerifiedContent \doteq
- DebunkedContent ÷
- UnreliableSource \doteq
- VerifyingSource ≐ Defined concepts

 ∃ hasSource⁻.Content Concept expressions of atomic concepts
 ∃ hasSource.TrustedSource

- ∃ verifiedBy.FactChecker
- \exists debunkedBy.FactChecker
- \exists hasSource⁻.DebunkedContent
- \exists hasSource⁻.VerifiedContent
 - ∀ hasSource⁻.VerifiedContent

Acyclic and unequivocal!



INFO216: Knowledge Graphs

Expanded definitional TBox

- Acyclicity: no cyclic definitions in the TBox ("Terminology Box")
- Unequivocality: each named defined term is only used on the l.h.s. of a single definition
- Concept expansion:
 - every concept can be written as an expression of only atomic concepts
 - algorithm:
 - start with the expression that defines the concept
 - recursively replace all the defined concepts used in the expression with their definitions
 - halt when only atomic concepts remain



INFO216: Knowledge Graphs

Expanded definitional TBox

- Source [±] ∃ hasSource⁻.Content
- TrustedContent = \exists hasSource.TrustedSource
- VerifiedContent = \exists verifiedBy.FactChecker
- DebunkedContent = \exists debunkedBy.FactChecker
- UnreliableSource $\doteq \exists$ hasSource⁻.
 - ∃ debunkedBy.FactChecker
- VerifyingSource $\doteq \exists$ hasSource⁻.
 - ∃ verifiedBy.FactChecker
 - $\sqcap \forall$ hasSource⁻.
 - ∃ verifiedBy.FactChecker

Only basic concepts on the right hand sides!

Types of axioms

- Terminology axioms (TBox)
 - subsumptions: $\mathbf{C} \subseteq \mathbf{D}$
 - equivalences: $C \equiv D$
 - corresponds to: $\mathbf{C} \subseteq \mathbf{D}$, $\mathbf{D} \subseteq \mathbf{C}$
- Role axioms (RBox)
 - e.g., subsumptions: $\mathbf{R} \subseteq \mathbf{S}$
- Individual assertion axioms (ABox)
 - class assertions: **a**:**C**
 - role assertions: <a,b>:R
- Knowledge base $\mathcal{K} = (\mathcal{T}, \mathcal{A})$ or $\mathcal{K} = (\mathcal{T}, \mathcal{R}, \mathcal{A})$

a and b are *individuals*. R and S are *roles*!



INFO216: Knowledge Graphs

C and D are *expressions*!

Decision Problems



INFO216: Knowledge Graphs

Reasoning over knowledge bases

- What more can we do with ontologies?
- For example:
 - given a source ontology that describes media content along with its sources and trustworthiness
 - we can *answer questions* like, e.g.:
 - is trusted content a type of content?
 - can content be both verified and debunked?
 - is all verified content trusted?
 - competency questions are what we want an ontology to answer
 - DL offers a clear and compact way or representing and reasoning about questions such as these!



INFO216: Knowledge Graphs

Decision problems

- A computational problem with a yes/no answer, e.g.
 - is C subsumed by D?
 - are C and D consistent? $\mathcal{K} \models a: (C \sqcap D)$
 - are C and D *equivalent*? $\mathcal{K} \models C \equiv D$
 - are C and D disjoint?
 - does a belong to C:
 - is a *R-related* to b:
- $\mathcal{K} \models \mathbf{C} \equiv \mathbf{D}$ $\mathcal{K} \models \mathbf{C} \sqcap \mathbf{D} \sqsubseteq \bot$ $\mathcal{K} \models \mathbf{a}:\mathbf{C}?$

 $\mathcal{K} \models \mathbf{C} \sqsubseteq \mathbf{D}$

 $\mathcal{K} \models \langle a, b \rangle : \mathbb{R}$?

C and D are classes, a and b are individuals. R is a role!

- Given a knowledge base ${\mathcal K}$, reasoning engines can give yes / no answers
 - ...but not all decision problems are decidable
 - ...or have tractable *complexity*
 - depends on the expressions used!



INFO216: Knowledge Graphs

Decision problems in practice

- Description logic is implemented by *reasoning engines/OWL reasoner*
 - e.g., HermiT and Pellet
 - distinct from inference engines, such as OWL-RL
- Protegé-OWL
 - comes with HermiT, more plugins can be installed
- Solves decision problems, e.g.,
 - classifiy individuals
 - find subclass relationships (subsumptions)
 - find unsatisfiable classes (concepts)
 - detect inconsistencies



INFO216: Knowledge Graphs

Manchester OWL syntax

Manchester OWL-syntax

- A simple DL notation without special symbols
 - used by Protege-OWL to construct classes
 - similar to DL syntax
- Class: InternalCensor
 EquivalentTo: Censor and Employee
- Class: ExternalCensor EquivalentTo: Censor and not Employee
- Class: Agent

EquivalentTo: Person or Organisation or Group

- Can be used to *serialise* complete ontologies
 - ...we will look mostly at TBox expressions
- http://www.w3.org/TR/owl2-manchester-syntax/



INFO216: Knowledge Graphs

Comparison

• DL:

```
ExternalCensor - Censor - Employee
```

• Machester OWL:

```
Class: ExternalCensor
EquivalentTo: Censor and not Employee
```

• Turtle:

uib:ExternalCensor owl:equivalentClass owl:intersectionOf (uib:Censor [a owl:Class ; owl:complementOf uib:Employee]



(c) Andreas L Opdahl, 2023

Roles in Manchester OWL syntax

• Class: President

EquivalentTo:

Person and presidentOf some owl: Thing

• Class: USPresident

EquivalentTo:

Person and presidentOf some UnitedStates

• Class: Independent

EquivalentTo:

Person and not hasParty some owl: Thing

- universal concept (top): owl:Thing

- existential restriction: **some**



(c) Andreas L Opdahl, 2023

Null concept in Manchester OWL syntax

• Class: <class-name>

EquivalentTo: Person and Group SubClassOf: owl:Nothing

- null concept (bottom): owl:Nothing
- subsumption (subconcept): SubClassOf:
- equivalence: EquivalentTo:
 - ...used both for *definitions* and for *axio*ms



(c) Andreas L Opdahl, 2023

More roles in Manchester OWL syntax

- Class: LoyalRepublican
 EquivalentTo:
 Person and hasParty only RepublicanParty
 value restriction: only
- Class: Monotheist EquivalentTo: Person and

believesInDeity exactly 1

• Class: Polygamist

EquivalentTo: hasSpouse min 3

- number restriction: exactly, min, max

• Class: Narcissist EquivalentTo: loves some Self



INFO216: Knowledge Graphs

Inverse, symmetric and transitive roles

- Class: StrayDog
 EquivalentTo: Dog and not inverse hasOwner some Person
- Class: hasParent EquivalentTo: inverse hasChild
- ObjectProperty: hasSibling Characteristics: Symmetric
- ObjectProperty: hasAncestor Characteristics: Transitive
- inverse role: inverse
- symmetric role:

Characteristics: SymmetricProperty

• transitive role:

Characteristics: TransitiveProperty



INFO216: Knowledge Graphs

After Easter: Graph Embeddings