



# OWL The Web Ontology Language

### part II: beyond the basics

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### Next

### Quickly about (decidable) reasoning OWL and RDF

- OWL DL and OWL Full
- global restrictions

#### Modeling trickiness

- N-ary predicates
- meta-modeling
- OWA, UNA, and integrity constraints
- pain points: time and uncertainty





# Why reasoning?

Important for:

- quality assurance during ontology design
  - detects false entailments and non-entailments
  - esp. in case of multiple authors
- semantic integrations
  - errors during ontology re-use (remember imports)?
  - errors during ontology mapping and alignment
- deployment
  - any schema violations in my data?
  - is my data under-described?





### Reasoning

Typical reasoning problems given an ontology O:

- is O consistent?
- does O entail an axiom?
- classification: all class inclusions for named classes
- query answering
  - DL query (querying with arbitrary class expressions)
     ObjectIntersectionOf(:Person

ObjectSomeValue(:hasParent :Peter))

conjunctive queries (tomorrow)

Reduces to consistency

(as you know from DLs)





# On decidability

OWL is based on 20+ years of DL research

- largely about finding practical decision procedures
- decidability means restrictions on the language
- do we care?

#### Well, sort of yes

- optimizations are typically easier to develop
- semi-decidability insufficient!
  - O entails  $\alpha$  iff O  $\cup \{\alpha\}$  is inconsistent
  - if consistency is semi-decidable, entailment is not





### OWL and RDF

What does "OWL is based on RDF" mean?

- each OWL axiom maps to a set of RDF triples
- which require extra vocabulary (owl: namespace)

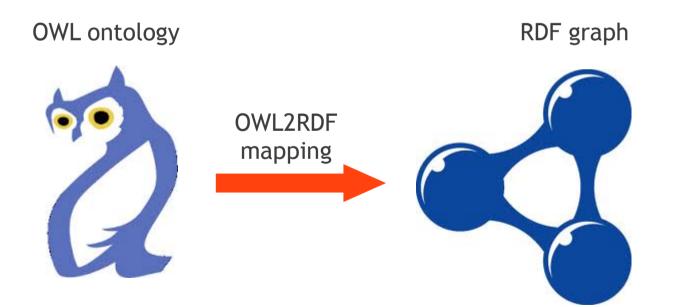




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# The OWL to RDF Mapping

- Entities are mapped to RDF resources
- Data values become literals
- Expressions and axioms are mapped to sets of triples





# The OWL to RDF Mapping

Entities are mapped to RDF resources

Data values become literals

Expressions and axioms are mapped to sets of triples

Class expression example:

• OWL: ObjectAllValuesFrom( :hasRelative :Griffins )

• RDF:

\_:x rdf:type owl:Restriction

\_:x owl:onProperty :hasRelative

\_:x owl:allValuesFrom :Griffins





#### RDF(S) has its own model-theoretic semantics





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RDF graph



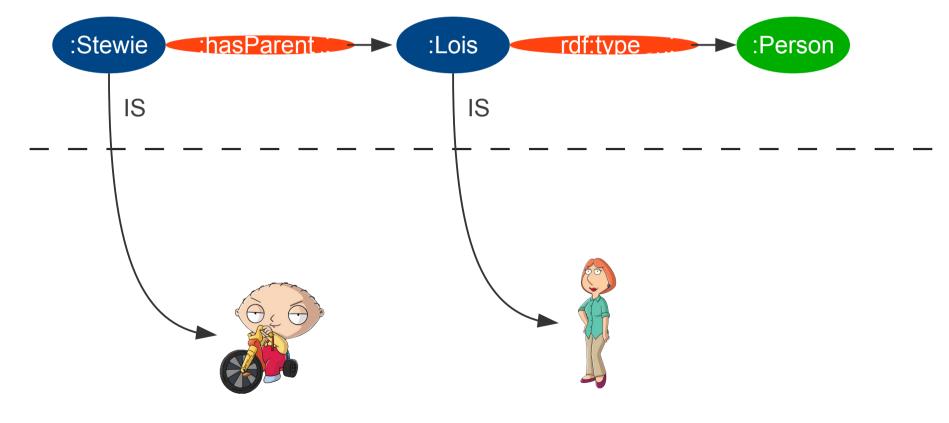
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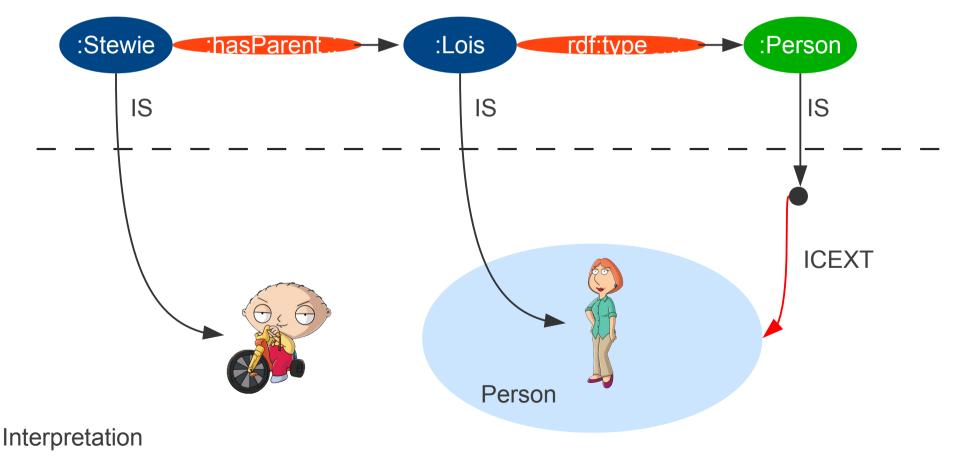
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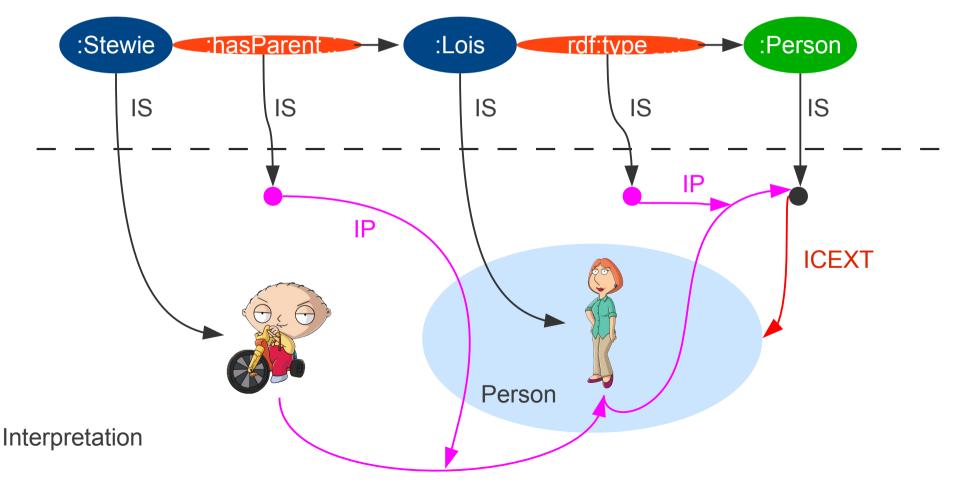






#### RDF(S) has its own model-theoretic semantics

RDF graph







## Extra semantic conditions

#### For **RDFS** resources:

#### $(c1, c2) \in IEXT(IS(rdfs:subClassOf)), then$

c1, c2 are classes,  $ICEXT(c1) \subseteq ICEXT(c2)$ 





## Extra semantic conditions

#### For **RDFS** resources:

 $(c1, c2) \in IEXT(IS(rdfs:subClassOf)), then$  $c1, c2 are classes, ICEXT(c1) \subseteq ICEXT(c2)$ Similar for all OWL resources

(z, c) ∈ IEXT(IS(owl:someValuesFrom)) and (z, p) ∈ IEXT(IS(owl:onProperty)), then ICEXT(z) = {x | ∃ y : (x,y) ∈ IEXT(p) and y ∈ ICEXT(c)} essentially encodes "z  $\sqsubseteq$  ∃p.c"





## Semantic correspondence

Ontology O can be interpreted in two ways:

- directly, via the DL model theory
- indirectly, as an RDF graph via the RDF model theory Natural question: are the semantics equivalent?





## Semantic correspondence

Ontology O can be interpreted in two ways:

- directly, via the DL model theory
- indirectly, as an RDF graph via the RDF model theory Natural question: are the semantics equivalent?
- by means of entailment
- well, mostly yes: the OWL 2 correspondence theorem let G1 and G2 be RDF graphs s.t.
   F(G1) and F(G2) are corresponding ontologies in FS\*
   F(G1) entails F(G2) under the DL semantics, then
   G1 entails G2 under the RDF semantics
  - \* which meet the OWL 2 DL global restrictions





# OWL 2 DL and OWL 2 Full

So every OWL ontology maps to an RDF graph What about the other way?

• is every RDF graph an OWL ontology?

w.r.t. some canonical parsing?





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- not in the DL sense
  - can make statements about the standard vocabulary <rdf:type rdf:type rdf:type> is a valid RDF triple!
  - too expressive (not in a decidable fragment of FOL)





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 too expressive (not in a decidable fragment of FOL)
 The decidable fragment is called OWL 2 DL
 What's beyond is OWL 2 Full - the dark side, an undecidable, very expressive ontology language





# OWL 2 DL syntactic restrictions

#### Can't use terms from owl:, rdf: etc. as entities

SubObjectPropertyOf (rdf:type :typeOf)





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Restrictions on datatypes

- no datatype occurs on LHS of two or more definitions
- datatype definitions are acyclic

   (all value spaces are exact, datatypes are unfoldable)
   DatatypeDefinition( :TaxNumber
   DatatypeRestriction( xsd:string xsd:pattern "[0-9]{11}")

DatatypeDefinition(:AlternativeTaxNumber

DatatypeRestriction( xsd:string xsd:pattern "[0-9]{3}-[0-9]{7}")

DatatypeDefinition( :ID

DataUnionOf( :TaxNumber :AlternativeTaxNumber ) )





# Complex object properties

Property is **complex** if its assertions can be derived from **other** property assertions

- this includes owl:topObjectProperty
- properties on the RHS of a chain

Otherwise it is simple

• Examples

SubObjectPropertyOf(ObjectPropertyChain(

:hasParent :hasBrother) :hasUncle)

SubObjectPropertyOf(:hasUncle :hasRelative)



# Restrictions on complex properties

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# Complex properties can't occur in cardinality restrictions

- ObjectMinCardinality
- ObjectMaxCardinality
- ObjectExactCardinality
- ObjectHasSelf

What we can't say:

- ObjectMinCardinality(2 :hasRelative owl:Thing)
- TranstitiveObjectProperty(:loves)
   ObjectHasSelf(:loves)



# Restrictions on property hierarchies

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Object property hierarchies must be regular

- let  $\rightarrow$  \* be the reflexive-transitive closure on properties
- must exist strict linear order < on properties

s.t. :p1 < :p2 means :p2  $\rightarrow$  \* :p1 doesn't hold



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- must exist strict linear order < on properties</li>

s.t. :p1 < :p2 means :p2  $\rightarrow$  \* :p1 doesn't hold

- each SubObjectPropertyOf (ObjectPropertyChain(:p1 ... :pn):p) axiom meets the following
  - SubObjectPropertyOf(ObjectPropertyChain(:p :p) :p ), or
  - :p is owl:topObjectProperty, or
  - :pi < :p for all i = 1 ... n, or
  - SubObjectPropertyOf(ObjectPropertyChain(:p :p1 ... :pn) :p), or
  - SubObjectPropertyOf(ObjectPropertyChain(:p1 ... :pn :p) :p)



#### ulm university universität UUUM Regular and irregular hierarchies

SubObjectPropertyOf (

ObjectPropertyChain( :hasFather :hasBrother ) :hasUncle ) SubObjectPropertyOf (

ObjectPropertyChain( :hasUncle :hasWife ) :hasAuntInLaw )

:hasFather < :hasBrother < :hasUncle < :hasWife < :hasAuntInLaw</pre>





Regular and irregular hierarchies

SubObjectPropertyOf ( ObjectPropertyChain

(:hasParent :hasSpouse :hasParent ) :hasGrandparent )

:hasParent < :hasSpouse < :hasGrandparent</pre>



# Regular and irregular hierarchies

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SubObjectPropertyOf ( ObjectPropertyChain (:hasFather :hasBrother ) :hasUncle ) SubObjectPropertyOf ( ObjectPropertyChain ( :hasChild :hasUncle ) :hasBrother ) no linear order between :hasUncle and :hasBrother

SubObjectPropertyOf ( ObjectPropertyChain (:p :s :r) :s) (:s, :s) can't be in <





# How're you feeling?

The OWL 2 DL vs. OWL 2 Full is tricky

- the OWL API will check the profile!
- and point to where you violate it

The rest is easier



- modeling issues
- where the Full stuff matters



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# OWL can't represent everything

It can't represent what FOL can't (naturally) represent

- temporal knowledge
- various sorts of uncertainty
- higher-order knowledge
- It has troubles with knowledge beyond the 2-var FOL
  - n-ary relationships of sorts





# N-ary stuff is problematic

OWL (and RDF) are 2-variable logics

- schema restrictions and properties are binary
   ObjectExactCardinalityFrom(2 :hasParent :Person)
   ObjectAllValuesFrom(:hasChild :Person)
- assertions are binary

How do we say:

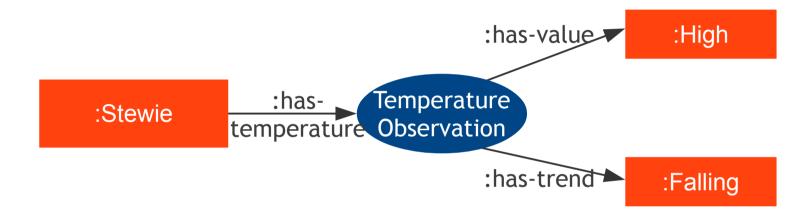
- Stewie has a high (but falling) temperature?
- Megan bought a book A from store B?
- Lois visited LAX, JFK, and BOS on a single trip?





### Workarounds

#### Via classes that work like reified properties



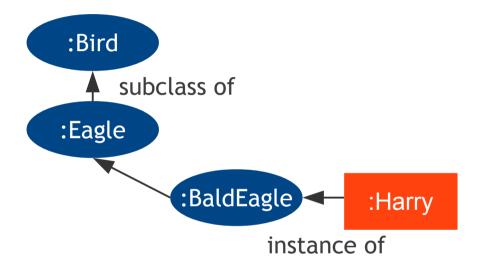
#### In OWL 2 property chains help

:has-temperature  $\circ$  :has-trend  $\sqsubseteq$  :has-temperature-trend





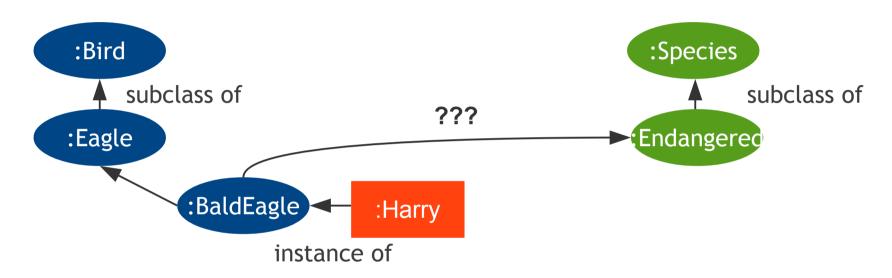
### Meta-modeling





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Meta-modeling



- :BaldEagle subclass of :Endangered would imply :Harry is a :Species
- :Species and :Endangered are meta-classes





# Meta-modeling in DL and Full

#### OWL 2 Full

- supports meta-modeling! ClassAssertion(:BaldEagle :EndangeredSpecies)
   OWL 2 DL
- limited support of meta-modeling In contrast to DL, OWL 2 Full:
- i. can use the built-in vocabulary
- ii. don't separate out classes, properties, and individuals
- iii. has no decidability restrictions





# Can it work in OWL 2 DL?

OWL Full is trivially undecidable due to iii. which isn't very useful for meta-modeling Is OWL 2 DL with i. and ii. decidable?





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- bad news: no
- good news: it's due to i. while we really want ii.
   who wants ClassAssertion(owl:allValuesFrom :X)?!
   Main question: how to allow ii. and still be first-order?
  - semantic extensions (B. Motik, 2007)
  - axiomatization (S. Rudolph and B. Glimm, 2010)



# Semantic extensions to OWL 2 DL

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Contextual semantics (or punning with entities)

- each name :n treated as :nclass, :nind, :nobj, :ndata depending on syntactic occurrence
- simple: ClassAssertion(:BaldEagle :EndangeredSpecies)
- no interaction between :BaldEagleclass, :BaldEagleind

 $\rightarrow$  no useful entailments

How about something more in the OWL 2 Full spirit?



ulm university universität UUUM Semantic extensions to OWL 2 DL

HiLog semantics

- $\Delta$  the domain
- I maps all entities to elements of  $\boldsymbol{\Delta}$
- $C^{I}: \Delta \rightarrow 2^{\Delta}$  atomic class extension
- $R^{I}: \Delta \rightarrow 2^{\Delta \times \Delta}$

Each entity has its identity, a dedicated domain element

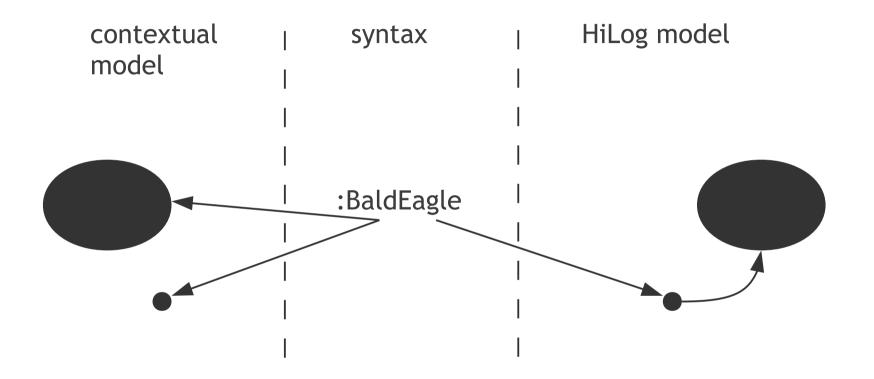
which is then extended to interpret the entity

Can be encoded in FOL





#### Contextual vs. HiLog





# Direct axiomatization in OWL 2 DL

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Extend the vocabulary

- classes: :Inst, :Class
- properties: :type, :subClassOf, :Rinst
- individuals: :oc for each normal class C



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Extend the vocabulary

- classes: :Inst, :Class
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- individuals: :oc for each normal class C

#### And restrict it

- DisjointClasses(:Inst :Class)
- ClassAssertion(oc :C), ClassAssertion(:i :Inst) for each :i, :C
- EquivalentClasses(:C ObjectSomeValuesFrom(:type :C))
- ObjectPropertyDomain(:R :Inst) for each :R
   ObjectPropertyDomain(:R :Inst)
- etc.-etc.





# Direct encoding in OWL 2 DL

#### So we

- conceptualize the meta-layer
- make sure it doesn't interfere with ontology layer
- no unwanted entailments due to the extra stuff (could be hidden behind a reasonable API/GUI)

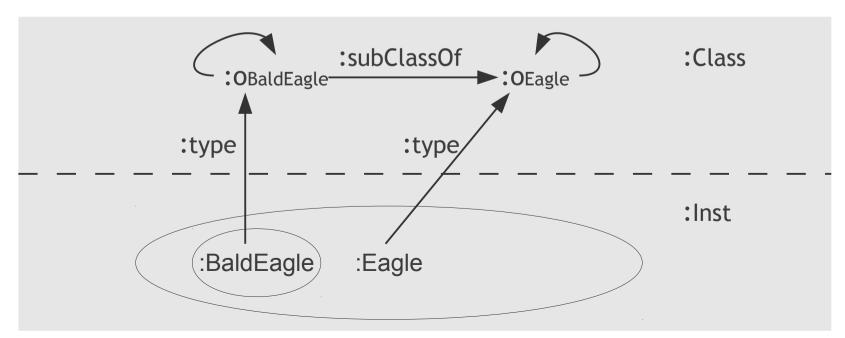




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#### Endangered $\rightarrow$ cannot be hunted, don't hunt Harry!





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Contextual semantics: can't do within logic





Endangered  $\rightarrow$  cannot be hunted, don't hunt Harry! Contextual semantics: can't do within logic

#### HiLog semantics

- need language extensions:
   Endangered(P) Λ P(i) → CantHunt(i)
- entails cantHunt(:Harry)





Endangered  $\rightarrow$  cannot be hunted, don't hunt Harry!

Contextual semantics: can't do logically

#### HiLog semantics

- need language extensions: Endangered(P)  $\land$  P(i)  $\rightarrow$  CantHunt(i)
- entails cantHunt(:Harry)

Axiomatization

ObjectPropertyAssertion(:subClassOf :OBaldEagle :OEndangered) SubClassOf(ObjectSomeValue(:type :OEndangered) :CantHunt) entails ClassAssertion(:Harry :CantHunt)





# Meta-modeling in OWL 2 DL

Some limited support is available:

- annotations (:isEndangered could be semantic-free)
- punning (BaldEagle-as-class vs. BaldEagle-as-instance) but not for properties

What's often done:

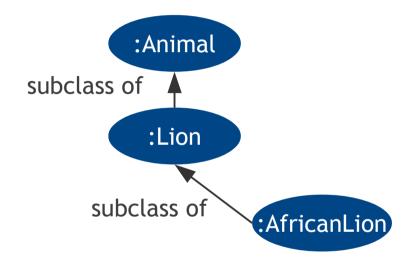
- parallel hierarchy of meta-classes and extra-logical linking
- OWL Full





### Classes as property values

Another example of meta-modeling

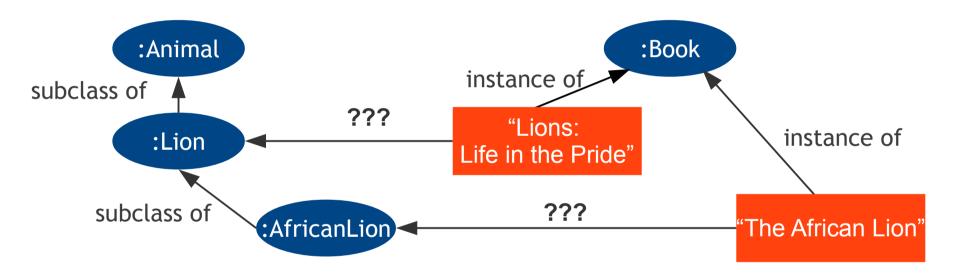






### Classes as property values

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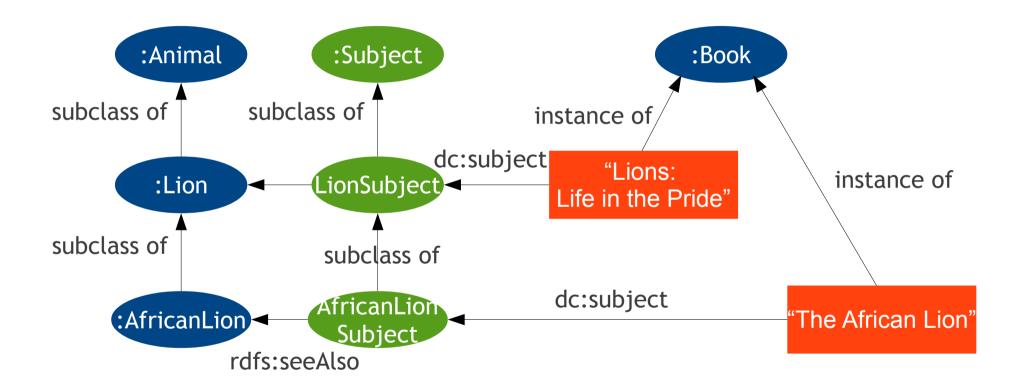


The books are not about some specific lions but about (African)Lion as a class



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# Workaround: parallel hierarchy



Obvious maintenance overhead for keeping the hierarchies in sync

Or (you guessed it!) OWL Full





# Integrity constraints

Popular idea: OWL as a constraint language for RDF

- take a Linked Data dataset
- describe ICs as OWL axioms
- validate!



Integrity constraints

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70ES NOT WOT

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#### Schema

SubClassOf(:Person
ObjectSomeValuesFrom(:hasParent :Person))

Data

ClassAssertion(:Stewie :Person)

Valid?





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Valid?

- yes!
- but Stewie is inferred to have a parent





#### Schema

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ObjectSomeValuesFrom(:hasParent :Person))

Data

ClassAssertion(:Stewie :Person)

Problem

**Open World Assumption** 

Stewie is not known to have a parent

but he must, otherwise it's inconsistent





#### Schema

SubClassOf(:Person

ObjectMaxCardinality(1 :hasMother :Woman)

Data

ClassAssertion(:Stewie :Person)

ObjectPropertyAssertion(:hasMother :Stewie :Lois) ObjectPropertyAssertion(:hasMother :Stewie :Peter) Valid?





#### Schema

- SubClassOf(:Person
- ObjectMaxCardinality(1 :hasMother :Woman)

Data

- ClassAssertion(:Stewie :Person)
- ObjectPropertyAssertion(:hasMother :Stewie :Lois)
- ObjectPropertyAssertion(:hasMother :Stewie :Peter) Valid?
- yes!
- but :Lois and :Peter are inferred to be identical





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- ClassAssertion(:Stewie :Person)
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- ObjectPropertyAssertion(:hasMother :Stewie :Peter)

Problem

Lack of the Unique Name Assumption Lois and Peter aren't known to be different





# OWL and ICs: proposals

Rules with **DL-queries** and **NAF** 

- $DL[Person(x)] \land DL[hasParent(x,y)] \rightarrow P(x,y)$
- DL[Person(x)]  $\land$  NAF[P(x,y)]  $\rightarrow \bot$

Minimal model interpretation

constraints checked in all minimal models
 ClassAssertion(:Stewie :Person)
 ClassAssertion(:Stewie

ObjectSomeValuesFrom(:hasParent :Person))

still valid!





### Integrity constraints as queries

### Instead of (non-recursive) rules we can use SPARQL a query language for RDF which can express NAF as OPTIONAL/FILTER/!BOUND (NOT EXISTS in SPARQL 1.1)





### Integrity constraints as queries

- Instead of (non-recursive) rules we can use SPARQL
  - a query language for RDF
  - which can express NAF as OPTIONAL/FILTER/!BOUND (NOT EXISTS in SPARQL 1.1)
- Check that every named person has a named parent
  - ASK WHERE { ?x rdf:type :Person .
  - OPTIONAL { ?x :hasParent ?y .
    - ?y rdf:type :Person . }
  - FILTER(!BOUND(?y))}
  - "yes" means a violation





### Integrity constraints as queries

Can be implemented by RDF databases

- keep axioms separately from data
- run queries as data changes

Syntax does not matter

- OWL axioms  $\rightarrow$  queries (Stardog)
- SPIN, queries as RDF triples (AllegroGraph) spinrdf.org





Time

OWL doesn't support temporal concepts:

- class of people who were employed before the crisis
- everyone will be eventually dead
- A was true, will be true, will be true after B... etc. Available out-of-the-box? XSD datatypes
  - xsd:dateTime, xsd:dateTimeStamp
  - Facts are expressible:

DataPropertyAssertion (:startTime

:MeetingA "2002-09-24-06:00"^^xsd:dateTime )





### Time: "solutions"

OWL Time (formerly DAML Time)

ontology on top of the existing logical model
 SubClassOf(:Process

ObjectSomeValuesFrom(:hasDuration time:Interval)

- may help standardize temporal vocabulary
- very limited temporal reasoning





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Various extensions based on temporal logics

Rule built-ins

Patient(?p)  $\Lambda$  hasTreatment(?p, ?t)  $\Lambda$  hasDrug(?t, DDI)  $\Lambda$ temporal:hasValidTime(?t, ?tVT)  $\Lambda$  temporal:before(?tVT, "1999")  $\rightarrow$  TrialEligible(?p)





### Uncertainty

Similar to Time: first-order logical model provides very limited means to capture uncertainty:

- disjunction
- Open World Assumption

information may be legitimately missing

• no Unique Name Assumption

captures canonical name uncertainty

New York and The Big Apple

different from name ambiguity!

New York as a city vs. New York as a state





# The sad state of affairs

At least 30 yrs of the "uncertainty in AI" research

- combinations of logic and probability
  - very-very-VERY hard (computationally and cognitively)
  - ClassAssertion(:Stewie :Infant 0.7)
- Bayesian and Markov models
  - computationally tractable
  - but propositional!
  - ... or, again, computationally impractical
- statistical black-box models (Breast Cancer Risk Calc)

No reusable modeling of uncertainty in SemWeb





### To summarize

#### OWL 2 isn't a silver bullet

But

- it's helpful in certain, reasonably understood scenarios
  - terminology management
  - data integration
- it matures fast
  - tool support is getting better
  - people accumulate experience

So

- you may try it for your next project
- and tell us about your experience! e.g. at OWLED!





#### Questions!