

Description Logic Reasoning

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Talk Outline

- Introduction to Description Logics
- Ontologies
- Ontology Reasoning
 - Why do we want it?
 - How do we do it?
- Tableaux Algorithms for Description Logic Reasoning
- Research Challenges
- Summary

Introduction to Description Logics

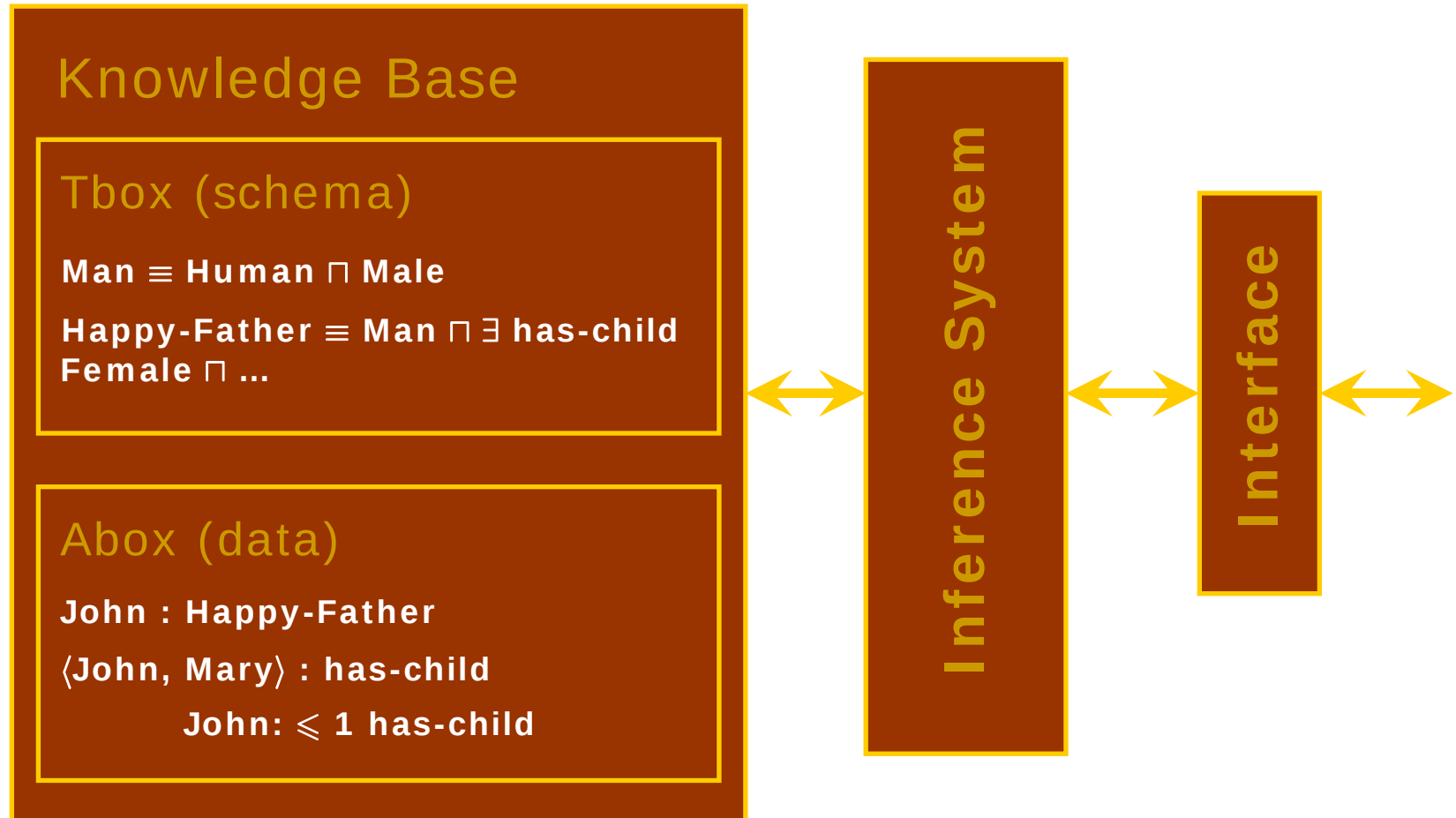
What Are Description Logics?

- A family of logic based Knowledge Representation formalisms
 - Descendants of **semantic networks** and **KL-ONE**
 - Describe domain in terms of **concepts** (classes), **roles** (properties, relationships) and **individuals**
- Distinguished by:
 - **Formal semantics** (typically model theoretic)
 - **Decidable fragments of FOL** (often contained in C_2)
 - Closely related to Propositional Modal & Dynamic Logics
 - Closely related to Guarded Fragment
 - Provision of **inference services**
 - Decision procedures for key problems (satisfiability, subsumption, etc)
 - Implemented systems (highly optimised)

DL Basics

- **Concept** names are equivalent to unary predicates
 - In general, concepts equiv to formulae with one free variable
- **Role** names are equivalent to binary predicates
 - In general, roles equiv to formulae with two free variables
- **Individual** names are equivalent to constants
- **Operators** restricted so that:
 - Language is decidable and, if possible, of low complexity
 - No need for explicit use of variables
 - Restricted form of $\exists$ and $\forall$ (direct correspondence with $\diamond$ and $\Box$)
 - Features such as counting can be succinctly expressed

DL System Architecture



The DL Family

- Given DL defined by set of **concept and role forming operators**
- Smallest propositionally closed DL is **$\mathcal{ALC}$** (equiv modal $K_{(m)}$)
 - Concepts constructed using $\sqcap$, $\sqcup$, $\neg$, $\exists$ and $\forall$
- **$\mathcal{S}$** often used for $\mathcal{ALC}$ with transitive roles (R_+)
- **Additional letters** indicate other extension, e.g.:
 - $\mathcal{H}$ for role inclusion axioms (role hierarchy)
 - $\mathcal{O}$ for nominals (singleton classes, written $\{x\}$)
 - $\mathcal{I}$ for inverse roles
 - $\mathcal{N}$ for number restrictions (of form $\leq nR$, $\geq nR$)
 - $\mathcal{Q}$ for qualified number restrictions (of form $\leq nR.C$, $\geq nR.C$)
- E.g., $\mathcal{ALC} + R_+ + \text{role hierarchy} + \text{inverse roles} + \text{QNR} = \mathcal{SHIQ}$
- Have been extended in many directions
 - Concrete domains, fixpoints, epistemic, n-ary, fuzzy, ...

DL Semantics

- Semantics defined by **interpretations**
- An interpretation $\mathcal{I} = (\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}})$, where
 - $\Delta^{\mathcal{I}}$ is the **domain** (a non-empty set)
 - $\cdot^{\mathcal{I}}$ is an **interpretation function** that maps:
 - **Concept** (class) name $A \rightarrow$ subset $A^{\mathcal{I}}$ of $\Delta^{\mathcal{I}}$
 - **Role** (property) name $R \rightarrow$ binary relation $R^{\mathcal{I}}$ over $\Delta^{\mathcal{I}}$
 - **Individual** name $i \rightarrow i^{\mathcal{I}}$ element of $\Delta^{\mathcal{I}}$

DL Semantics (cont.)

- Interpretation function $\mathcal{I}$ extends to concept (and role) **expressions** in the obvious way, e.g.:

$$(C \sqcap D)^{\mathcal{I}} = C^{\mathcal{I}} \cap D^{\mathcal{I}}$$

$$(C \sqcup D)^{\mathcal{I}} = C^{\mathcal{I}} \cup D^{\mathcal{I}}$$

$$(\neg C)^{\mathcal{I}} = \Delta^{\mathcal{I}} \setminus C^{\mathcal{I}}$$

$$\{x\}^{\mathcal{I}} = \{x^{\mathcal{I}}\}$$

$$(\exists R.C)^{\mathcal{I}} = \{x \mid \exists y. \langle x, y \rangle \in R^{\mathcal{I}} \wedge y \in C^{\mathcal{I}}\}$$

$$(\forall R.C)^{\mathcal{I}} = \{x \mid \forall y. (x, y) \in R^{\mathcal{I}} \Rightarrow y \in C^{\mathcal{I}}\}$$

$$(\leq n R)^{\mathcal{I}} = \{x \mid \#\{y \mid \langle x, y \rangle \in R^{\mathcal{I}}\} \leq n\}$$

$$(\geq n R)^{\mathcal{I}} = \{x \mid \#\{y \mid \langle x, y \rangle \in R^{\mathcal{I}}\} \geq n\}$$

$$(R^{-})^{\mathcal{I}} = \{(x, y) \mid (y, x) \in R^{\mathcal{I}}\}$$

DL Knowledge Base

- A DL **Knowledge base** $\mathcal{K}$ is a pair $\langle \mathcal{T}, \mathcal{A} \rangle$ where
 - $\mathcal{T}$ is a set of “terminological” axioms (the Tbox)
 - $\mathcal{A}$ is a set of “assertional” axioms (the Abox)
- **Tbox axioms** are of the form:
 $C \sqsubseteq D, C \equiv D, R \sqsubseteq S, R \equiv S$ and $R^+ \sqsubseteq R$
where C, D concepts, R, S roles, and R^+ set of transitive roles
- **Abox axioms** are of the form:
 $x:D, \langle x,y \rangle : R$
where x,y are individual names, D a concept and R a role

Knowledge Base Semantics

- An **interpretation** $\mathcal{I}$ satisfies (models) a Tbox axiom A ($\mathcal{I} \models A$):

$$\mathcal{I} \models C \sqsubseteq D \text{ iff } C^{\mathcal{I}} \subseteq D^{\mathcal{I}} \qquad \mathcal{I} \models C \equiv D \text{ iff } C^{\mathcal{I}} = D^{\mathcal{I}}$$

$$\mathcal{I} \models R \sqsubseteq S \text{ iff } R^{\mathcal{I}} \subseteq S^{\mathcal{I}} \qquad \mathcal{I} \models R \equiv S \text{ iff } R^{\mathcal{I}} = S^{\mathcal{I}}$$

$$\mathcal{I} \models R^+ \sqsubseteq R \text{ iff } (R^{\mathcal{I}})^+ \subseteq R^{\mathcal{I}}$$

- $\mathcal{I}$ **satisfies a Tbox** $\mathcal{T}$ ($\mathcal{I} \models \mathcal{T}$) iff $\mathcal{I}$ satisfies every axiom A in $\mathcal{T}$

- An **interpretation** $\mathcal{I}$ satisfies (models) an Abox axiom A ($\mathcal{I} \models A$):

$$\mathcal{I} \models x:D \text{ iff } x^{\mathcal{I}} \in D^{\mathcal{I}} \qquad \mathcal{I} \models \langle x,y \rangle : R \text{ iff } (x^{\mathcal{I}}, y^{\mathcal{I}}) \in R^{\mathcal{I}}$$

- $\mathcal{I}$ **satisfies an Abox** $\mathcal{A}$ ($\mathcal{I} \models \mathcal{A}$) iff $\mathcal{I}$ satisfies every axiom A in $\mathcal{A}$

- $\mathcal{I}$ **satisfies an KB** $\mathcal{K}$ ($\mathcal{I} \models \mathcal{K}$) iff $\mathcal{I}$ satisfies both $\mathcal{T}$ and $\mathcal{A}$

Short History of Description Logics

Phase 1:

- **Incomplete** systems (Back, Classic, Loom, . . .)
- Based on **structural algorithms**

Phase 2:

- Development of **tableau algorithms** and complexity results
- Tableau-based systems for **Pspace** logics (e.g., Kris, Crack)
- Investigation of **optimisation techniques**

Phase 3:

- Tableau algorithms for **very expressive** DLs
- **Highly optimised** tableau systems for **ExpTime** logics (e.g., FaCT, DLP, Racer)
- Relationship to modal logic and decidable fragments of FOL

Recent Developments

Phase 4:

- Mainstream **applications** and **tools**
 - **Databases**
 - Consistency of conceptual schemata (EER, UML etc.)
 - Schema integration
 - Query subsumption (w.r.t. a conceptual schema)
 - **Ontologies**, e-Science and Semantic Web/Grid
 - Ontology engineering (schema design, maintenance, integration)
 - Reasoning with ontology-based annotations (data)
- Mature **implementations**
 - Research implementations
 - FaCT, FaCT++, Racer, Pellet, ...
 - Commercial implementations
 - Cerebra system from Network Inference (and now Racer)

Ontologies

Ontology: Origins and History

a philosophical discipline—a branch of philosophy that deals with the nature and the organisation of reality

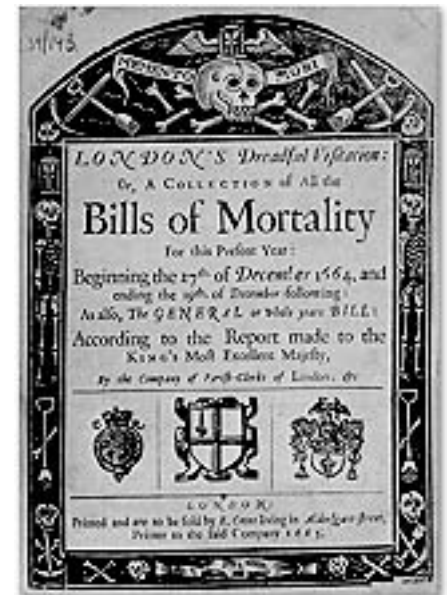
- Science of Being (Aristotle, *Metaphysics*, IV, 1)
- Tries to answer the questions:
 - *What characterizes being?*
 - *Eventually, what is being?*
- How should things be classified?

Classification: An Old Problem

Extract from *Bills of Mortality*, published weekly from 1664-1830s

The Diseases and Casualties this Week:

Aged	54	...	
Apoplectic	1	Suddenly	1
....		Surfeit	87
Fall down stairs	1	Teeth	113
Gangrene	1	...	
Grief	1	Ulcer	2
Gripping in the Guts	74	Vomiting	7
...		Winde	8
Plague	3880	Worms	18

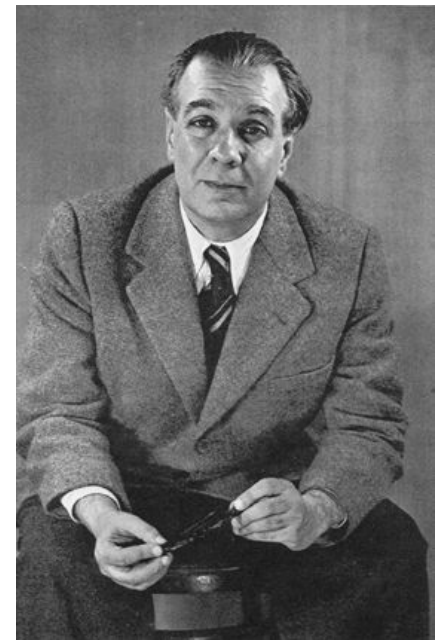


Classification: An Old Problem

Attributed to “a certain Chinese encyclopaedia entitled *Celestial Empire of benevolent Knowledge*”. Jorge Luis Borges: *The Analytical Language of John Wilkins*

On those remote pages it is written that animals are divided into:

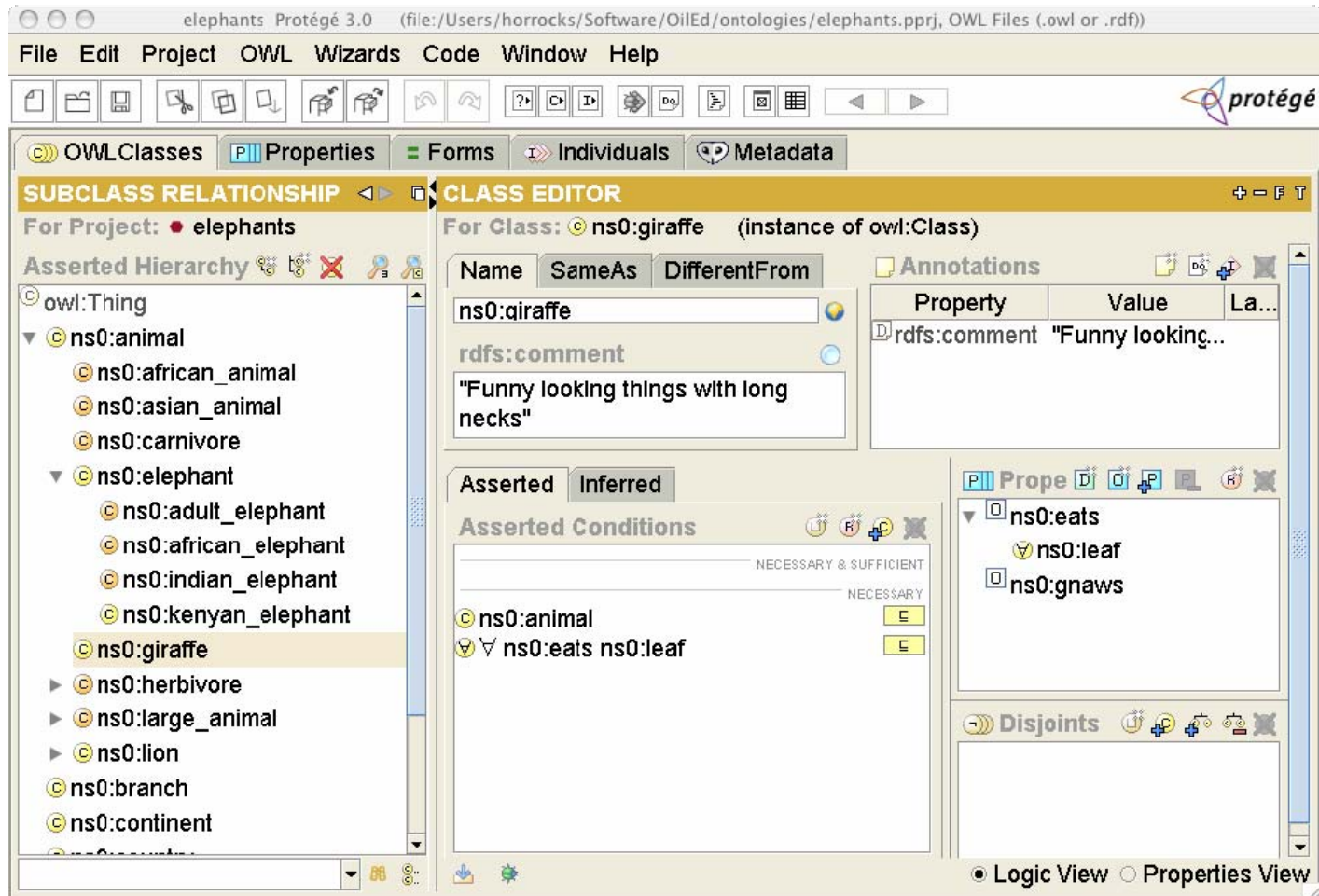
- a. those that belong to the Emperor
- b. embalmed ones
- c. those that are trained
- d. suckling pigs
- e. mermaids
- f. fabulous ones
- g. stray dogs
- h. those that are included in this classification
- i. those that tremble as if they were mad
- j. innumerable ones
- k. those drawn with a very fine camel's hair brush
- l. others
- m. those that have just broken a flower vase
- n. those that from a long way off look like flies



Ontology in Computer Science

- An ontology is an engineering artefact consisting of:
 - A **vocabulary** used to describe (a particular view of) some domain
 - An **explicit specification** of the **intended meaning** of the vocabulary.
 - almost always includes how concepts should be classified
 - Constraints capturing **additional knowledge** about the domain
- Ideally, an ontology should:
 - Capture a **shared understanding** of a domain of interest
 - Provide a **formal** and **machine manipulable** model of the domain

Example Ontology (Protégé)



Where are ontologies used?

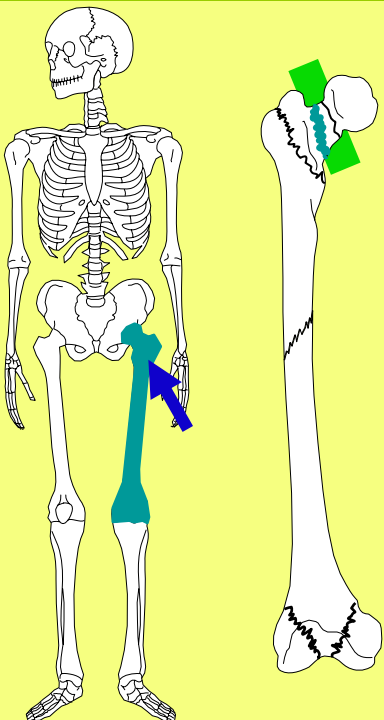
- **e-Science**, e.g., Bioinformatics
 - The Gene Ontology
 - The Protein Ontology (MGED)
 - “in silico” investigations relating theory and data
- **Medicine**
 - Terminologies
- **Databases**
 - Integration
 - Query answering
- **User interfaces**
- **Linguistics**
- **The Semantic Web**

Ontology Driven User Interface

★★★ Structured Data Entry

File Edit Help

FRACTURE SURGERY



Reduction Fixation

Open Closed

Femur Tibia Fibula Ankle More...

Humerus Radius Ulna Wrist More...

Left Right

Shaft Neck Gt Troch More...

• Fixation of open fracture of neck of left femur

Scientific American, May 2001:



Beware of the Hype

Ontology Reasoning: Why do We Want It?

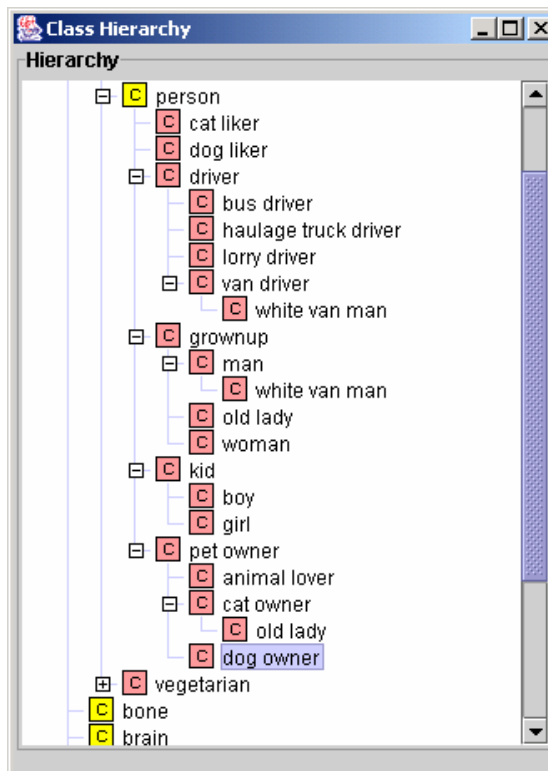
Why Ontology Reasoning?

- Given key role of ontologies in many applications, it is essential to provide **tools** and **services** to help users:
 - Design and maintain high quality ontologies, e.g.:
 - **Meaningful** — all named classes can have instances
 - **Correct** — captured intuitions of domain experts
 - **Minimally redundant** — no unintended synonyms
 - **Richly axiomatised** — (sufficiently) detailed descriptions
 - Answer **queries** over ontology classes and instances, e.g.:
 - Find more general/specific classes
 - Retrieve individuals/tuples matching a given query
 - **Integrate** and align multiple ontologies

Why Decidable Reasoning?

- OWL is an W3C standard DL based ontology language
 - OWL constructors/axioms **restricted** so reasoning is decidable
- Consistent with Semantic Web's **layered architecture**
 - XML provides syntax **transport layer**
 - RDF(S) provides basic **relational language** and simple ontological primitives
 - OWL provides powerful but still decidable **ontology language**
 - Further layers (e.g. SWRL) will extend OWL
 - Will almost certainly be undecidable
- W3C requirement for “**implementation experience**”
 - “Practical” decision procedures
 - Several implemented systems
 - Evidence of empirical tractability

System Demonstration (OilEd)



Oiled 3.5.3

File Log Reasoner Help Export

Classes Properties Individuals Axioms Container Namespaces Imports

Classes

- bus company
- bus driver
- car
- cat
- cat liker
- cat owner
- colour
- company
- cow
- dog
- dog liker
- dog owner
- driver
- giraffe
- girl
- grass
- grownup
- haulage company
- haulage truck driver
- haulage worker

Find

Name

dog owner

Properties

☐ SubclassOf
☒ SameClassAs

Documentation

Classes

person

Restrictions

type	property	filler
has-class	has pet	dog

Inherited Restrictions

type	property	filler
has-class	has pet	animal
has-class	eats	thing

D:\Program Files\Oiled3-5-3\ontologies\mad_cows

Ontology Reasoning:

How do we do it?

Use a (Description) Logic

- OWL DL based on *SHIQ* Description Logic
 - In fact it is equivalent to *SHOIN(D_n)* DL
- OWL DL Benefits from many years of DL research
 - Well defined *semantics*
 - *Formal properties* well understood (complexity, decidability)
 - Known *reasoning algorithms*
 - *Implemented systems* (highly optimised)
- In fact there are three “species” of OWL (!)
 - *OWL full* is union of OWL syntax and RDF
 - *OWL DL* restricted to First Order fragment ($\approx$ DAML+OIL)
 - *OWL Lite* is “simpler” subset of OWL DL (equiv to *SHIF(D_n)*)

Class/Concept Constructors

Constructor	DL Syntax	Example	FOL Syntax
intersectionOf	$C_1 \sqcap \dots \sqcap C_n$	Human $\sqcap$ Male	$C_1(x) \wedge \dots \wedge C_n(x)$
unionOf	$C_1 \sqcup \dots \sqcup C_n$	Doctor $\sqcup$ Lawyer	$C_1(x) \vee \dots \vee C_n(x)$
complementOf	$\neg C$	$\neg$ Male	$\neg C(x)$
oneOf	$\{x_1\} \sqcup \dots \sqcup \{x_n\}$	{john} $\sqcup$ {mary}	$x = x_1 \vee \dots \vee x = x_n$
allValuesFrom	$\forall P.C$	$\forall$ hasChild.Doctor	$\forall y.P(x, y) \rightarrow C(y)$
someValuesFrom	$\exists P.C$	$\exists$ hasChild.Lawyer	$\exists y.P(x, y) \wedge C(y)$
maxCardinality	$\leq nP$	≤ 1 hasChild	$\exists \leq n y.P(x, y)$
minCardinality	$\geq nP$	≥ 2 hasChild	$\exists \geq n y.P(x, y)$

- C is a concept (class); P is a role (property); x is an individual name
- XMLS **datatypes** as well as classes in $\forall P.C$ and $\exists P.C$
 - Restricted form of DL **concrete domains**

RDFS Syntax

E.g., $\text{Person} \sqcap \forall \text{hasChild} . (\text{Doctor} \sqcup \exists \text{hasChild} . \text{Doctor})$:

```
<owl:Class>
  <owl:intersectionOf rdf:parseType=" collection">
    <owl:Class rdf:about="#Person"/>
    <owl:Restriction>
      <owl:onProperty rdf:resource="#hasChild"/>
      <owl:toClass>
        <owl:unionOf rdf:parseType=" collection">
          <owl:Class rdf:about="#Doctor"/>
          <owl:Restriction>
            <owl:onProperty rdf:resource="#hasChild"/>
            <owl:hasClass rdf:resource="#Doctor"/>
          </owl:Restriction>
        </owl:unionOf>
      </owl:toClass>
    </owl:Restriction>
  </owl:intersectionOf>
</owl:Class>
```

Ontology / Tbox & Abox Axioms

OWL Syntax	DL Syntax	Example
subClassOf	$C_1 \sqsubseteq C_2$	Human $\sqsubseteq$ Animal $\sqcap$ Biped
equivalentClass	$C_1 \equiv C_2$	Man $\equiv$ Human $\sqcap$ Male
subPropertyOf	$P_1 \sqsubseteq P_2$	hasDaughter $\sqsubseteq$ hasChild
equivalentProperty	$P_1 \equiv P_2$	cost $\equiv$ price
transitiveProperty	$P^+ \sqsubseteq P$	ancestor ⁺ $\sqsubseteq$ ancestor

OWL Syntax	DL Syntax	Example
type	$a : C$	John : Happy-Father
property	$\langle a, b \rangle : R$	$\langle \text{John}, \text{Mary} \rangle : \text{has-child}$

- Obvious **FOL** equivalences
 - E.g., DL: $C \sqsubseteq D$ FOL: $\forall x.C(x) \rightarrow D(x)$

Description Logic Reasoning

DL Reasoning: Basics (I)

- Key reasoning tasks reducible to (un)satisfiability
 - E.g., $C \sqsubseteq D$ iff $C \sqcap \neg D$ is *not* satisfiable
- Tableau algorithms used to test **satisfiability** (consistency)
- Try to build a **tree-like model** of the input concept C
- Decompose C syntactically
 - Apply tableau **expansion rules**
 - Infer constraints on elements of model
- Tableau rules correspond to constructors in logic ($\sqcap, \sqcup$ etc)
 - Some rules are **nondeterministic** (e.g., $\sqcup, \leq$)
 - In practice, this means **search**
- Stop when no more rules applicable or **clash** occurs
 - Clash is an obvious contradiction, e.g., $A(x), \neg A(x)$

DL Reasoning: Basics (II)

- Cycle check (**blocking**) may be needed for termination
- C satisfiable **iff** rules can be applied such that a fully expanded clash free tree is constructed:

Terminating

- Bounds on out-degree (rule applications per node) and depth (blocking) of tree

Sound

- Can construct a tableau, and hence a model, from a fully expanded and clash-free tree

Complete

- Can use a model to guide application of non-deterministic rules and so construct a clash-free tree

DL Reasoning: Advanced Techniques

- Satisfiability w.r.t. an Ontology $\mathcal{O}$
 - For each axiom $C \sqsubseteq D \in \mathcal{O}$, add $\neg C \sqcup D$ to every node label
- More expressive DLs
 - Basic technique can be extended to deal with
 - Role inclusion axioms (role hierarchy)
 - Number restrictions
 - Inverse roles
 - Concrete domains/datatypes
 - Aboxes
 - etc.
 - Extend expansion rules and use more sophisticated blocking strategy
 - Forest instead of Tree (for Aboxes)
 - Root nodes correspond to individuals in Abox

DL Reasoning: Optimised Implementations

- Naive implementation can lead to effective **non-termination**
 - 10 GCIs $\times$ 10 nodes $\rightarrow 2^{100}$ different possible expansions
- Modern systems include **MANY** optimisations
- Optimised **classification** (compute partial ordering)
 - Enhanced traversal (exploits information from previous tests)
 - Use structural information to select classification order
- Optimised **satisfiability**/subsumption testing
 - Normalisation and simplification of concepts
 - Absorption (simplification) of axioms
 - Dependency directed backtracking
 - Caching of satisfiability results and (partial) models
 - Heuristic ordering of propositional and modal expansion
 - ...

Research Challenges: What next?

Increased Expressive Power

- OWL not expressive enough for some applications
 - Constructors mainly for classes (unary predicates)
 - No complex datatypes or built in predicates (e.g., arithmetic)
 - No variables
 - No higher arity predicates
- Rules language extension (SWRL) already developed
 - Horn clauses where predicates are OWL classes and properties
 - Resulting language is undecidable
- OWL-FOL also proposed
 - Extends SWRL with explicit quantification

Improved Scalability

- Reasoning is hard (NExpTime-complete for OWL-DL)
- Web ontologies may grow very large
- Good empirical evidence of scalability/tractability for DL systems
 - E.g., 5,000 (complex) classes; 100,000+ (simple) classes
 - But evidence mostly w.r.t. SHF (no inverse)
- Reasoning with individuals
 - Deployment of web ontologies will mean reasoning with (possibly very large numbers of) individuals/tuples
 - Unlikely that standard Abox techniques will be able to cope

Other Reasoning Tasks

- Querying
 - Retrieval and instantiation wont be sufficient
 - Minimum requirement will be **DB style query language**
 - May also need “what can I say about x?” style of query
- Explanation
 - To support ontology design
 - **Justifications and proofs** (e.g., of query results)
- “Non-Standard Inferences”, e.g., LCS, matching
 - To support ontology integration
 - To support **“bottom up” design** of ontologies

Tools and Infrastructure

- Adoption of OWL and realisation of Semantic Web will require development of wide range of tools and infrastructure
 - Not just editors, but complete ontology development environments
 - Annotation tools, including (semi-)automated annotation of existing content
 - Reasoning systems/query engines
 - ...

Summary

- DLs are a family of **logic based Knowledge Representation formalisms**
 - Describe domain in terms of **concepts**, **roles** and **individuals**
- An **Ontology** is an engineering artefact consisting of:
 - A **vocabulary** of terms
 - An **explicit specification** their **intended meaning**
- Ontologies play a **key role** in many applications
 - e-Science, Medicine, Databases, Semantic Web, etc.

Summary

- Reasoning is important
 - Essential for design, maintenance and deployment of ontologies
- Reasoning support currently based on DL systems
 - Tableaux decision procedures
 - Highly optimised implementations
- Many challenges remain
 - Including extensions up to and including FOL

**Enough work to keep logic based KR community
busy for many years to come 😊**

Acknowledgements

Thanks to my many friends in the DL and ontology communities, in particular:

- Alan Rector
- Franz Baader
- Uli Sattler



Resources

- Slides from this talk
 - <http://www.cs.man.ac.uk/~horrocks/Slides/iccs05.ppt>
- FaCT system (open source)
 - <http://www.cs.man.ac.uk/FaCT/>
- OilEd (open source)
 - <http://oiled.man.ac.uk/>
- Protégé
 - <http://protege.stanford.edu/plugins/owl/>
- W3C Web-Ontology (WebOnt) working group (OWL)
 - <http://www.w3.org/2001/sw/WebOnt/>
- **DL Handbook**, Cambridge University Press
 - <http://books.cambridge.org/0521781760.htm>