

# Scalable Ontology Systems

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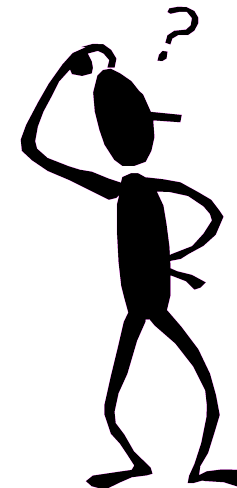
# What is an Ontology?





# What is an Ontology?

“A specification of a conceptualization” [Gruber]





# What is an Ontology?

A model of (some aspect of) the world

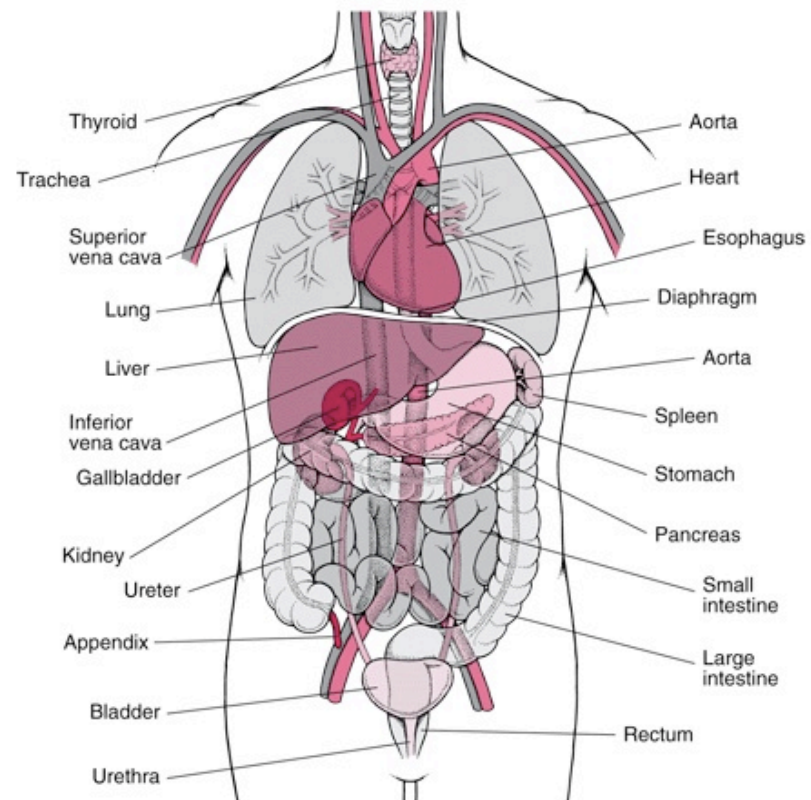




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- Introduces **vocabulary** relevant to domain, e.g.:
  - Anatomy

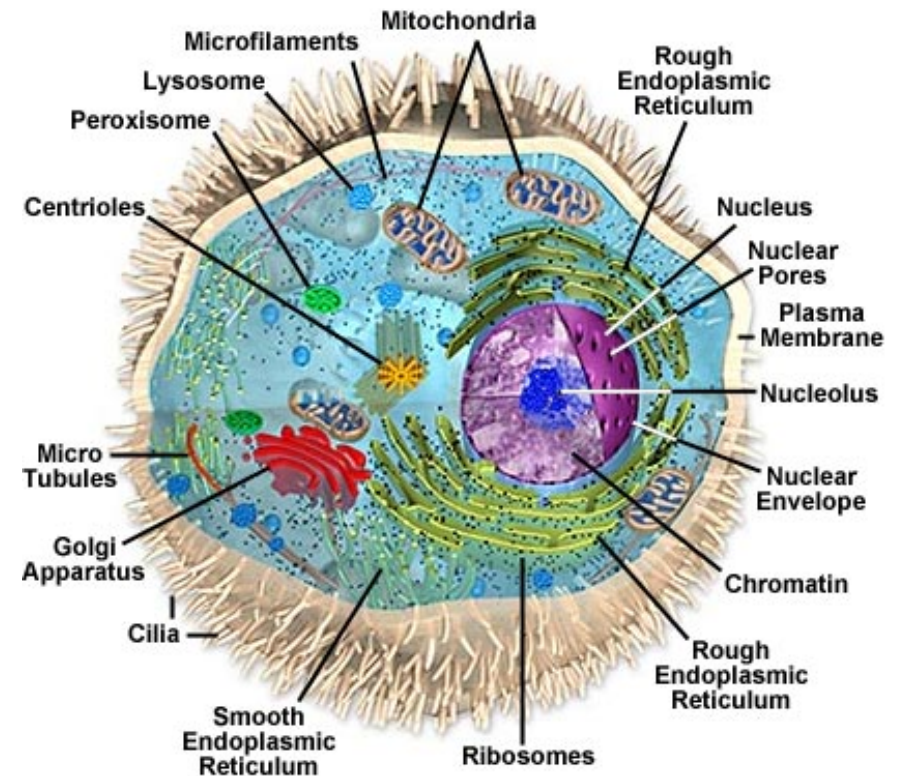




# What is an Ontology?

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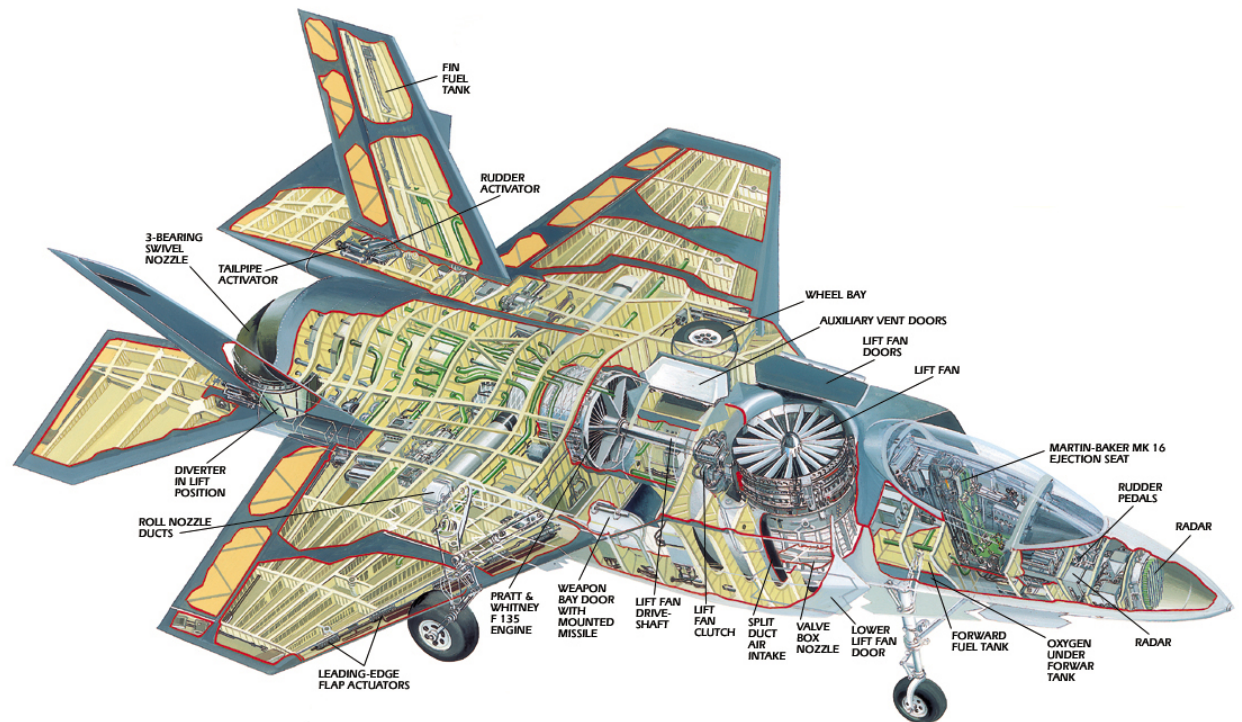




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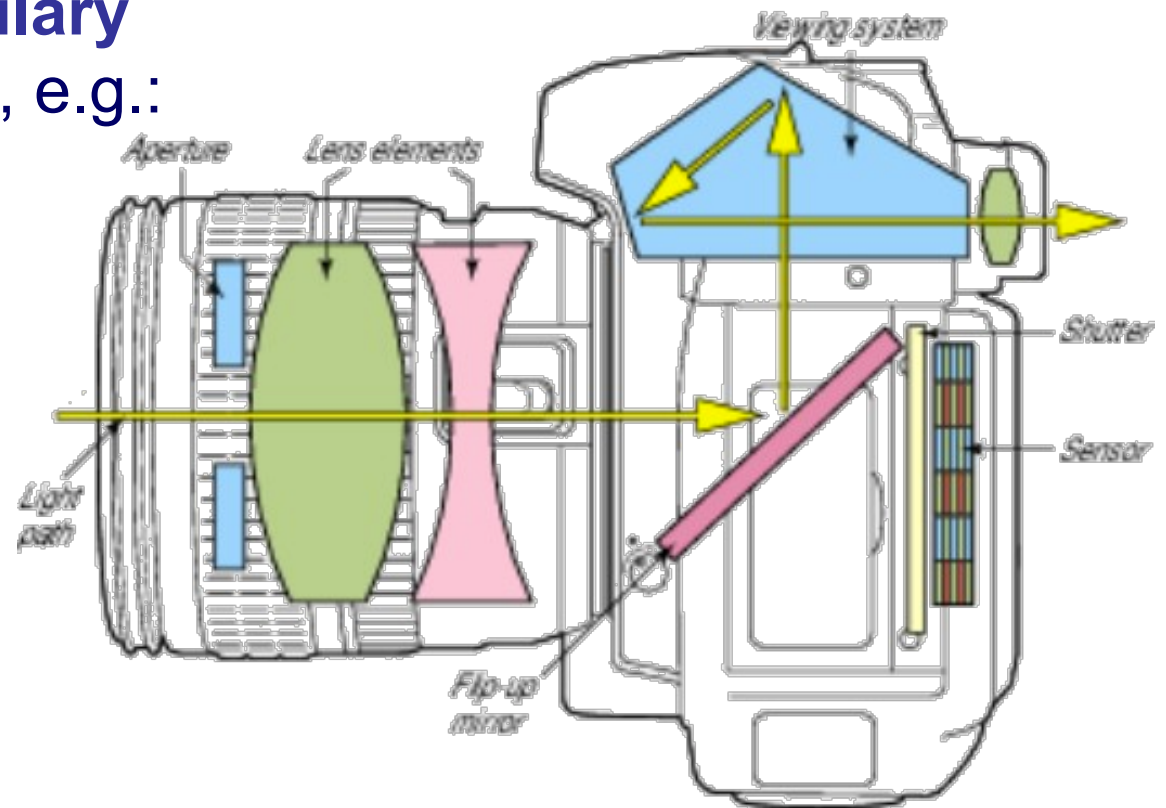




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  - Cellular biology
  - Aerospace
  - Photography



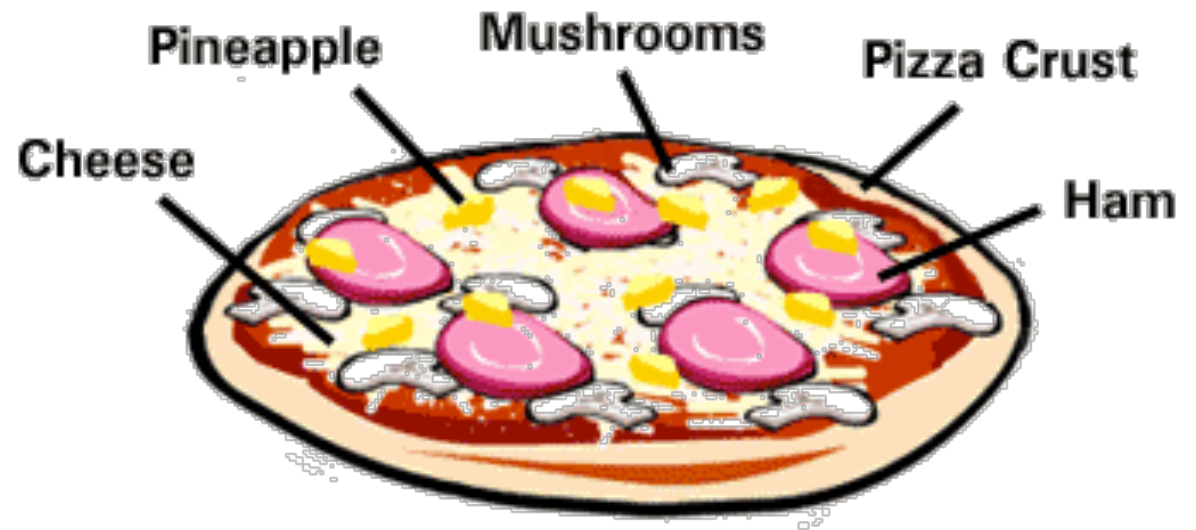




# What is an Ontology?

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  - Cellular biology
  - Aerospace
  - Photography
  - Pizzas
  - ...



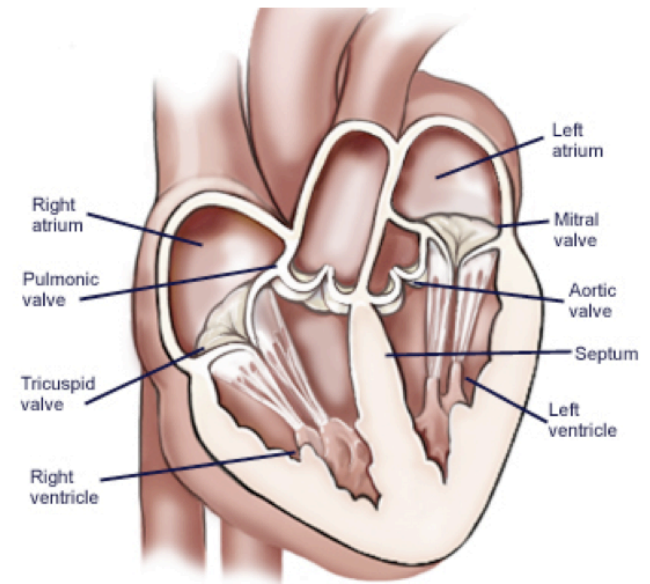


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- Introduces **vocabulary** relevant to domain
- Specifies **meaning** (semantics) of terms

Heart **is** a muscular organ that **is part of** the circulatory system





# What is an Ontology?

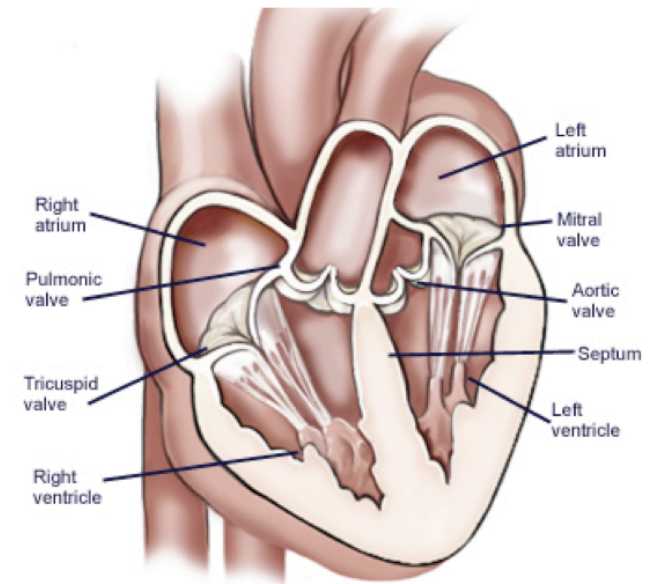
A model of (some aspect of) the world

- Introduces **vocabulary** relevant to domain
- Specifies **meaning** (semantics) of terms

Heart **is a** muscular organ that **is part of** the circulatory system

- **Formalised** using suitable logic

$$\forall x. [\text{Heart}(x) \rightarrow \text{MuscularOrgan}(x) \wedge \exists y. [\text{isPartOf}(x, y) \wedge \text{CirculatorySystem}(y)]]$$





# Description Logics (DLs)

- Fragments of **first order logic** designed for KR
- Useful computational properties
  - **Decidable** (essential)
  - Low complexity (desirable)
- Succinct and **variable free syntax**

$$\forall x. [\text{Heart}(x) \rightarrow \text{MuscularOrgan}(x) \wedge \\ \exists y. [\text{isPartOf}(x, y) \wedge \\ \text{CirculatorySystem}(y)]]$$

$$\text{Heart} \sqsubseteq \text{MuscularOrgan} \sqcap \\ \exists \text{isPartOf}. \text{CirculatorySystem}$$



# Description Logics (DLs)

DL **Knowledge Base** (KB) consists of two parts:

- Ontology (aka **TBox**) axioms define terminology (schema)

$\text{Heart} \sqsubseteq \text{MuscularOrgan} \sqcap$   
 $\exists \text{isPartOf}.\text{CirculatorySystem}$

$\text{HeartDisease} \equiv \text{Disease} \sqcap$   
 $\exists \text{affects}.\text{Heart}$

$\text{VascularDisease} \equiv \text{Disease} \sqcap$   
 $\exists \text{affects} . (\exists \text{isPartOf}.\text{CirculatorySystem})$

- Ground facts (aka **ABox**) use the terminology (data)

$\text{John} : \text{Patient} \sqcap$   
 $\exists \text{suffersFrom}.\text{HeartDisease}$





# Ontology Applications

THE  
SEMANTIC  
WEB





# What is the Semantic Web?





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- According to **TBL** circa 1998:

“... a **consistent logical web of data** ...” in which  
“... information is given **well-defined meaning** ...”







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- By now has evolved into:
  - “a platform for distributed applications and sharing (linking) data”
  - **RDF** provides uniform syntactic structure for data
  - **Ontologies** provide machine readable schemas
- **A wide ranging research effort:**
  - aimed at extracting “useful information” from web content
  - with KR (in particular ontologies) playing a key role





# Web Ontology Languages

- RDF extended to **RDFS**, a primitive ontology language
  - classes and properties; sub/super-classes (and properties); range and domain (of properties)
- But RDFS **lacks** important **features**, e.g.:
  - existence/cardinality constraints; transitive/inverse properties; localised range and domain constraints, ...
- And RDF(S) has “higher order flavour” with no (later **non-standard**) **formal semantics**
  - difficult to understand
  - difficult to provide reasoning support





# From RDFS to OWL

- **OIL** language developed in **On-To-Knowledge** project





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- **OIL** language developed in **On-To-Knowledge** project
- **DAML-ONT** language later developed in **DAML** program
- Efforts soon merged to produce **DAML+OIL**
  - Further development carried out by “Joint EU/US Committee”





# From RDFS to OWL

- **OIL** language developed in **On-To-Knowledge** project
- **DAML-ONT** language later developed in **DAML** program
- Efforts soon merged to produce **DAML+OIL**
  - Further development carried out by “Joint EU/US Committee”
- DAML+OIL submitted to **W3C** as basis for standardisation
- **WebOnt** Working Group formed
  - WebOnt developed OWL language based on DAML+OIL
  - OWL became a W3C recommendation
  - “Web-friendly” syntax for *SHOIN*





# Why (Description) Logic?

- OWL exploits results of 20+ years of DL research
  - Well defined (model theoretic) **semantics**

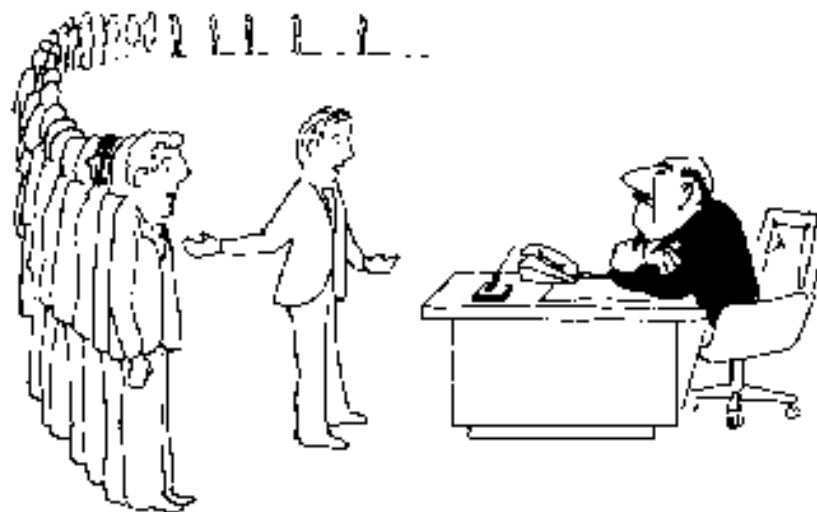
Constructor	DL Syntax	Example	FOL Syntax
intersectionOf	$C_1 \sqcap \dots \sqcap C_n$	Human $\sqcap$ Male	$C_1(x) \wedge \dots \wedge C_n(x)$
unionOf	$C_1 \sqcup \dots \sqcup C_n$	Doctor $\sqcup$ Lawyer	$C_1(x) \vee \dots \vee C_n(x)$
complementOf	$\neg C$	$\neg$ Male	$\neg C(x)$
oneOf	$\{x_1\} \sqcup \dots \sqcup \{x_n\}$	{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	$\leq_n P$	$\leq 1$ hasChild	$\exists^{\leq n} y.P(x, y)$
minCardinality	$\geq_n P$	$\geq 2$ hasChild	$\exists^{\geq n} y.P(x, y)$





# Why (Description) Logic?

- OWL exploits results of 20+ years of DL research
  - Well defined (model theoretic) **semantics**
  - **Formal properties** well understood (complexity, decidability)



**I can't find an efficient algorithm, but neither can all these famous people.**

[Garey & Johnson. Computers and Intractability: A Guide to the Theory of NP-Completeness. Freeman, 1979.]





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  - Well defined (model theoretic) **semantics**
  - **Formal properties** well understood (complexity, decidability)
  - Known **reasoning algorithms**

$\sqcap$ -rule	if 1. $(C_1 \sqcap C_2) \in \mathcal{L}(v)$ , $v$ is not indirectly blocked, and 2. $\{C_1, C_2\} \not\subseteq \mathcal{L}(v)$ then $\mathcal{L}(v) \rightarrow \mathcal{L}(v) \cup \{C_1, C_2\}$ .
$\sqcup$ -rule	if 1. $(C_1 \sqcup C_2) \in \mathcal{L}(v)$ , $v$ is not indirectly blocked, and 2. $\{C_1, C_2\} \cap \mathcal{L}(v) = \emptyset$ then $\mathcal{L}(v) \rightarrow \mathcal{L}(v) \cup \{E\}$ for some $E \in \{C_1, C_2\}$
$\exists$ -rule	if 1. $\exists r.C \in \mathcal{L}(v_1)$ , $v_1$ is not blocked, and 2. $v_1$ has no safe $r$ -neighbour $v_2$ with $C \in \mathcal{L}(v_2)$ , then create a new node $v_2$ and an edge $\langle v_1, v_2 \rangle$ with $\mathcal{L}(v_2) = \{C\}$ and $\mathcal{L}(\langle v_1, v_2 \rangle) = \{r\}$ .
$\forall$ -rule	if 1. $\forall r.C \in \mathcal{L}(v_1)$ , $v_1$ is not indirectly blocked, and 2. there is an $r$ -neighbour $v_2$ of $v_1$ with $C \notin \mathcal{L}(v_2)$ then $\mathcal{L}(v_1) \rightarrow \mathcal{L}(v_1) \cup \{C\}$ .
$\forall_+$ -rule	if 1. $\forall r.C \in \mathcal{L}(v_1)$ , $v_1$ is not indirectly blocked, and 2. there is some role $r'$ with $\text{Trans}(r')$ and $r' \sqsubseteq r$ 3. there is an $r'$ -neighbour $v_2$ of $v_1$ with $\forall r'.C \notin \mathcal{L}(v_2)$ then $\mathcal{L}(v_1) \rightarrow \mathcal{L}(v_1) \cup \{\forall r'.C\}$ .
choose-rule	if 1. $\leq n r.C \in \mathcal{L}(v_1)$ , $v_1$ is not indirectly blocked, and 2. there is an $r$ -neighbour $v_2$ of $v_1$ with $\{C, \dot{C}\} \cap \mathcal{L}(v_2) = \emptyset$ then $\mathcal{L}(v_1) \rightarrow \mathcal{L}(v_1) \cup \{E\}$ for some $E \in \{C, \dot{C}\}$ .
$\geq$ -rule	if 1. $\geq n r.C \in \mathcal{L}(v)$ , $v$ is not blocked, and 2. there are not $n$ safe $r$ -neighbours $v_1, \dots, v_n$ of $v$ with $C \in \mathcal{L}(v_i)$ and $v_i \neq v_j$ for $1 \leq i < j \leq n$



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- OWL exploits results of 20+ years of DL research
  - Well defined (model theoretic) **semantics**
  - **Formal properties** well understood (complexity, decidability)
  - Known **reasoning algorithms**
  - **Scalability** demonstrated by **implemented systems**





# Tools, Tools, Tools

**Major benefit** of OWL has been huge increase in range and sophistication of tools and infrastructure:





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- Editors/development environments

The image displays three overlapping windows from different OWL development environments:

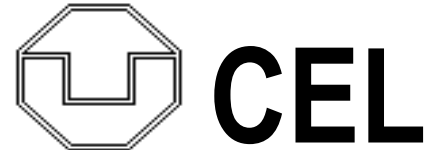
- OntoTrack (left):** Shows a hierarchical class diagram for 'cyc.owl'. The root class is 'Thing', which branches into 'Individual' and 'Relation'. 'Individual' further branches into 'TemporalThing', 'SpatialThing', 'SolidTangible', and 'PartiallyIntangible'. 'SpatialThing' branches into 'SomethingExisting' and 'SpatialThingLocalized'. 'SomethingExisting' branches into 'Agent-Generic' and 'Place'. 'SpatialThingLocalized' branches into 'Place' and 'PartiallyTangible'. 'PartiallyIntangible' branches into 'PartiallyIntangible' and 'Intangible'. 'Intangible' branches into 'MyClass'. 'Relation' branches into 'TruthValue' and 'Mass'. 'Mass' branches into 'Temperature'. A 'Classes' list on the left includes 'man', 'sheep', 'tree', 'van', 'van driver', 'vegetarian', 'vehicle', 'white van man', and 'woman'. A 'Restrictions' table shows 'has-class' with property 'drives' and value '(has color)'. The bottom status bar shows the path '/home/horrocks/systems/OilEd/ontologies/mad\_cows.dam'.
- SWOLP v2.2b (top right):** Shows a class tree for 'http://sweet.gpl.nasa.gov/ontology/space.owl#DistanceCategory'. The tree includes classes like 'Intersection of', 'Disjoint with', 'Subclass of', and 'Superclass of'. A 'Changes' panel on the right shows a list of changes, including 'REMOVE SUPER\_CLASS' and 'ADD DISJOINT\_CLASSES'.
- Protégé (bottom right):** Shows a detailed view of an ontology class, 'Phenomenon'. The 'General' tab shows the name 'Phenomenon' and namespace 'Symptoms'. The 'Subclasses' tab shows 'Hallucination', 'Anxiety', 'SensoryDeprivation', and 'WeightLoss'. The 'Datatype Prop...' and 'Associations' tabs are also visible. The 'Instances' tab shows a list of instances, including 'hallucination 1.1', 'hallucination 1.2', 'anxiety', and 'weightloss'.



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- Reasoners
- Explanation, justification and pinpointing

The screenshot shows the SWOOP v2.3 beta 3.1 (Jan 2006) interface. The main window displays the 'OWL Ontology: tambis-full.owl' with 'Annotations' and 'Root/Derived Debugging Information'. The debugging information includes 144 unsatisfiable classes, categorized into root and derived unsatisfiable classes.

root unsat. classes (3)	parent dependencies
<a href="#">metal</a> (141)	
<a href="#">metalloid</a> (140)	
<a href="#">nonmetal</a> (140)	

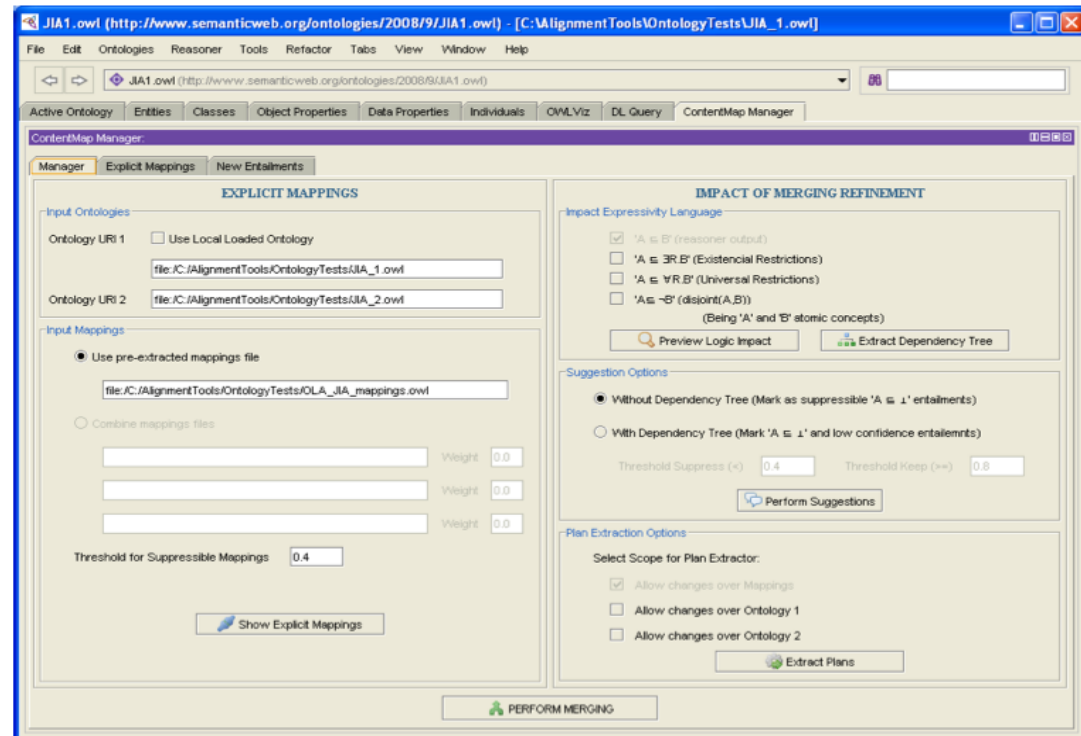
derived unsat. classes (141)	parent dependencies
<a href="#">acetylation-site</a>	<a href="#">modification-site</a> , <a href="#">protein-part</a> ,
<a href="#">active-site</a>	<a href="#">macromolecule-part</a> , <a href="#">protein</a> , <a href="#">site</a> , <a href="#">protein-part</a> ,
<a href="#">alkali-metal</a>	<a href="#">nonmetal</a> , <a href="#">?</a> , <a href="#">metal</a> , <a href="#">metalloid</a> ,
<a href="#">alpha-helix</a>	<a href="#">protein-structure</a> , <a href="#">protein-secondary-structure</a> ,
<a href="#">amidation-site</a>	<a href="#">macromolecular-compound</a> ,
<a href="#">amino-acid</a>	<a href="#">modification-site</a> , <a href="#">protein-part</a> ,
<a href="#">anti-codon</a>	<a href="#">organic-molecular-compound</a> ,
<a href="#">astatine</a>	<a href="#">small-organic-molecular-compound</a> ,
<a href="#">atom</a>	<a href="#">rna-part</a> , <a href="#">macromolecule-part</a> , <a href="#">rna</a> ,
<a href="#">beta-sheet</a>	<a href="#">nonmetal</a> , <a href="#">?</a> , <a href="#">metal</a> , <a href="#">metalloid</a> ,
	<a href="#">nonmetal</a> , <a href="#">metal</a> , <a href="#">metalloid</a> ,
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	<a href="#">macromolecular-compound</a> ,



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- Editors/development environments
- Reasoners
- Explanation, justification and pinpointing
- Integration and modularisation
- APIs, in particular the [OWL API](#)

```
Revision 1403 - (download) (annotate)  
Fri Dec 18 17:14:37 2009 UTC (4 months, 2 weeks ago) by matthewhorridge  
File size: 4711 byte(s)  
1 package org.coode.owlapi.examples;  
2  
3 import org.semanticweb.owlapi.apibinding.OWLManager;  
4 import org.semanticweb.owlapi.model.*;  
5 import org.semanticweb.owlapi.util.DefaultPrefixManager;  
6 /*  
7  * Copyright (C) 2009, University of Manchester  
8  *  
9  * Modifications to the initial code base are copyright of their  
10 * respective authors, or their employers as appropriate. Authorship  
11 * of the modifications may be determined from the ChangeLog placed at  
12 * the end of this file.  
13 *  
14 * This library is free software; you can redistribute it and/or  
15 * modify it under the terms of the GNU Lesser General Public  
16 * License as published by the Free Software Foundation; either  
17 * version 2.1 of the License, or (at your option) any later version.  
18 *  
19 * This library is distributed in the hope that it will be useful,  
20 * but WITHOUT ANY WARRANTY; without even the implied warranty of  
21 * MERCHANTABILITY or FITNESS FOR A PARTICULAR PURPOSE. See the GNU  
22 * Lesser General Public License for more details.  
23
```



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- Reasoners allow domain experts to check if, e.g.:
  - classes are consistent (no “obvious” errors)

The screenshot shows a software interface for ontology reasoning. At the top, there are two buttons: "Concise Format" and "Abstract Syntax". Below them, a window titled "OWL-Class: mad+cow" is visible. In the foreground, a window titled "Explanation" is open, displaying the following text:

**Axioms causing the inference**  
**mad+cow = owl:Nothing:**

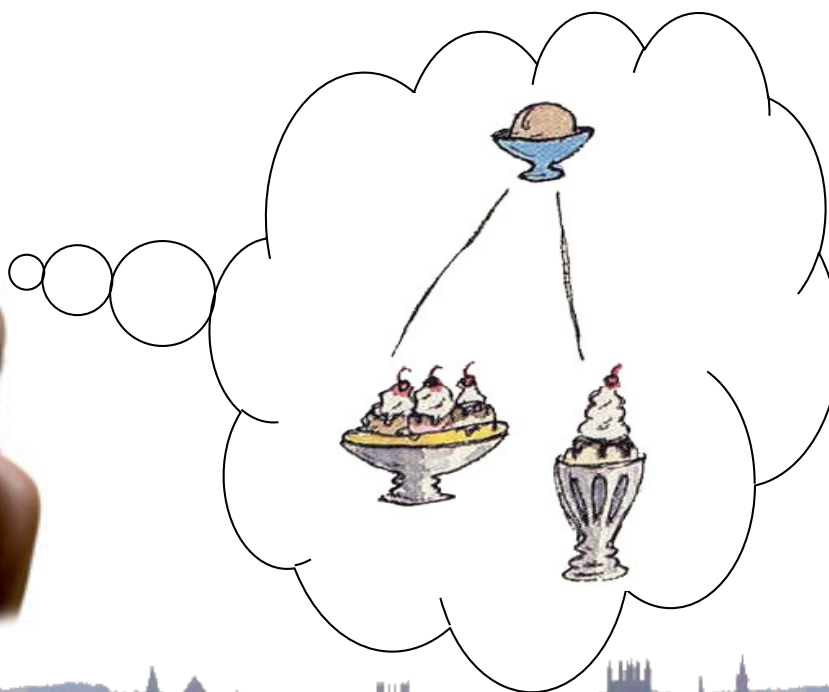
- 1) (mad+cow = ((∃eats . ((∃part+of . sheep) ∩ brain)) ∩ cow))
- 2) |\_(sheep ⊆ animal)
- 3) |\_(cow ⊆ vegetarian)
- 4) |\_(vegetarian = (animal ∩ (∃eats . (¬ animal)) ∩ (∃eats . (¬ (∃part+of . animal)))))

At the bottom of the explanation window, there is a checkbox labeled "Strike out irrelevant parts of axioms". Below the explanation window, a yellow box contains the text "owl:Nothing (Why?)".



# Why Ontology Reasoning?

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  - expected subsumptions hold (consistent with intuitions)



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- Developing and maintaining quality ontologies is *hard*
- Reasoners allow domain experts to check if, e.g.:
  - classes are consistent (no “obvious” errors)
  - expected subsumptions hold (consistent with intuitions)
  - unexpected equivalences hold (unintended synonyms)





# Ontology Applications

- OWL ontologies being **deployed** in increasing number and range of applications
  - eScience, eCommerce, geography, engineering, defence, ...
  - major impact in healthcare and life sciences
- Now a mainstream technology supported by, e.g., **Oracle 11g**
  - Increasing impact in business applications





# Ontology Applications

**WILSHIRE**  
*conferences*

## Designing and Building Business Ontologies

An Intensive 4-DAY SEMINAR with Workshops and Demonstrations, on Semantically Enabled Enterprise led by Dave McComb and Simon Robe

### Seminar Objectives

Participants will:

- Gain an understanding of what an ontology is and what it can be used for.
- Understand how representing information in an ontology goes beyond a conceptual model or a simple taxonomy
- Understand the difference between frame based/ declarative classes and description logic based/ derivable classes.
- Understand the difference between open world and closed world models.
- Understand the basic principles for designing Ontologies for corporate applications.

**Tuition Fee: \$2,450**



# Healthcare and Life Sciences

- **OBO foundry** includes more than 100 biological and biomedical ontologies
- **Siemens** “actively building OWL based clinical solutions”
- OWL tools used to find and repair critical errors in ontology used at **Columbia Presbyterian**
- **SNOMED-CT** (Clinical Terms) ontology
  - used in healthcare systems of more than 15 countries, including Australia, Canada, Denmark, Spain, Sweden and the UK
  - also used by major US providers, e.g., Kaiser Permanente
  - ontology provides common vocabulary for recording clinical data





# Case Study: SNOMED

It's **BIG** – over 400,000 concepts





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The screenshot shows the ClniClue 2006: SNOMED CT interface. The main window displays the concept 'TB - Pulmonary tuberculosis' with Concept Id 154283005 and Description Id 1784750013. The interface is divided into several panes:

- Search Results:** A list of search results for 'pulmonary tuber', with 'TB - Pulmonary tuberculosis' highlighted.
- Hierarchy:** A tree view showing the concept's position within the SNOMED CT hierarchy, including 'pneumonitis', 'tuberculosis', and 'pulmonary disease due to Mycobacteria'.
- Definition:** A detailed view of the concept's definition, including 'pulmonary tuberculosis (disorder)', 'inflammatory disorder of lower respiratory tract', and 'pulmonary disease due to Mycobacteria'.

Annotations with arrows point to specific elements in the interface:

- Pulmonary Tuberculosis:** Points to the main concept name in the top right.
- pneumonitis:** Points to the 'pneumonitis' entry in the 'is a' section of the definition pane.
- inflammatory disorder of lower respiratory tract:** Points to the 'inflammatory disorder of lower respiratory tract' entry in the 'is a' section of the definition pane.
- Pulmonary disease due to Mycobacteria:** Points to the 'pulmonary disease due to Mycobacteria' entry in the 'is a' section of the definition pane.
- found in lung structure:** Points to the 'lung structure' entry in the 'Group' section of the definition pane.



# Case Study: SNOMED

- **Kaiser Permanente** extending SNOMED to express, e.g.:
  - *non-viral pneumonia* (negation)
  - *infectious pneumonia* is caused by a *virus* or a *bacterium* (disjunction)
  - *double pneumonia* occurs in *two lungs* (cardinalities)
- This is easy in **SNOMED-OWL**
  - but reasoner failed to find expected subsumptions, e.g., that *bacterial pneumonia* is a kind of *non-viral pneumonia*
- Ontology highly **under-constrained**: need to add disjointness axioms (at least)
  - *virus* and *bacterium* must be disjoint



# Case Study: SNOMED

- Adding disjointness led to **surprising results**
  - many classes become inconsistent, e.g., *percutaneous embolization of hepatic artery using fluoroscopy guidance*
- Cause of **inconsistencies** identified as class *groin*
  - *groin* asserted to be subclass of both *abdomen* and *leg*
  - *abdomen* and *leg* are disjoint
  - modelling of *groin* (and other similar “junction” regions) identified as incorrect





# Case Study: SNOMED

- Correct modelling of groin is quite complex, e.g.:
  - groin has a part that is part of the abdomen, and has a part that is part of the leg (*inverse properties*)

$\text{Groin} \sqsubseteq \exists \text{hasPart} . (\exists \text{isPartOf} . \text{Abdomen})$

$\text{Groin} \sqsubseteq \exists \text{hasPart} . (\exists \text{isPartOf} . \text{Leg})$

$\text{hasPart} \equiv \text{isPartOf}^{-}$

- all parts of the groin are part of the abdomen or the leg (**disjunction**)

$\text{Groin} \sqsubseteq \forall \text{hasPart} . (\exists \text{isPartOf} . (\text{Abdomen} \sqcup \text{Leg}))$

- ...





# Case Study: SNOMED

## What we learned:

- Ontology engineering is **error prone**
  - errors of omission (e.g., disjointness) and commission (e.g., modelling of groin)
- **Expressive features** of OWL are sometimes needed
- Sophisticated tool support is **essential**
  - handling ontologies of this size is challenging
  - domain experts (and logicians!) often need help to understand the (root) cause of both inconsistencies and non-subsumptions
  - surprising and unexplained (non-) inferences are frustrating for users and may cause them to lose faith in the reasoner



# What About Scalability?

- Tools only **useful in practice** if they can deal with large ontologies and/or large data sets
- Unfortunately, many ontology languages are highly intractable
  - OWL 2 satisfiability is **2NExpTime-complete** w.r.t. schema
  - and **NP-Hard** w.r.t. data (upper bound open)
- Problem addressed in practice by
  - Algorithms that work well in **typical cases**
  - Highly **optimised implementations**
  - Use of **tractable fragments**





# Reasoning Algorithms

Most OWL reasoners based on (hyper-) **tableau**

- Reasoning tasks reducible to (un)**satisfiability**
  - E.g.,  $\mathcal{O} \models \text{HeartDisease} \sqsubseteq \text{VascularDisease}$  iff  $\mathcal{O} \cup \{x : (\text{HeartDisease} \sqcap \neg \text{VascularDisease})\}$  is *not* satisfiable
- Algorithm tries to **construct** (abstraction of) a **model**
- Success trivially proves **non-subsumption**
  - we have constructed a counter-model
- Model search designed such that failure proves non-existence of model, and hence **subsumption**





# Highly Optimised Implementations

- Lazy unfolding
- Simplification and rewriting
- Search optimisations
- Caching
- Optimised blocking
- Heuristics
- Fast semi-decision procedures
- Algebraic methods
- Nominal absorption
- Individual reuse
- ...

Computationally **sub-optimal**, but **highly effective** in practice





# Problem Solved?

**Implementation of  
ExpTime algorithms  
is futile!**





# Problem Solved?

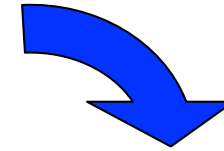
**Identify (class of)  
problematic ontologies**





# Problem Solved?

**Identify (class of)  
problematic ontologies**



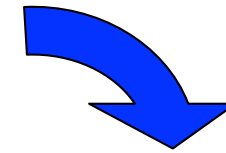
**Implement/  
Optimise**





# Problem Solved?

**Identify (class of)  
problematic ontologies**



**Implement/  
Optimise**



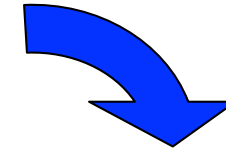
**Deploy in  
applications**





# Problem Solved?

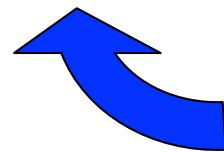
**Identify (class of)  
problematic ontologies**



**Implement/  
Optimise**



**Deploy in  
applications**

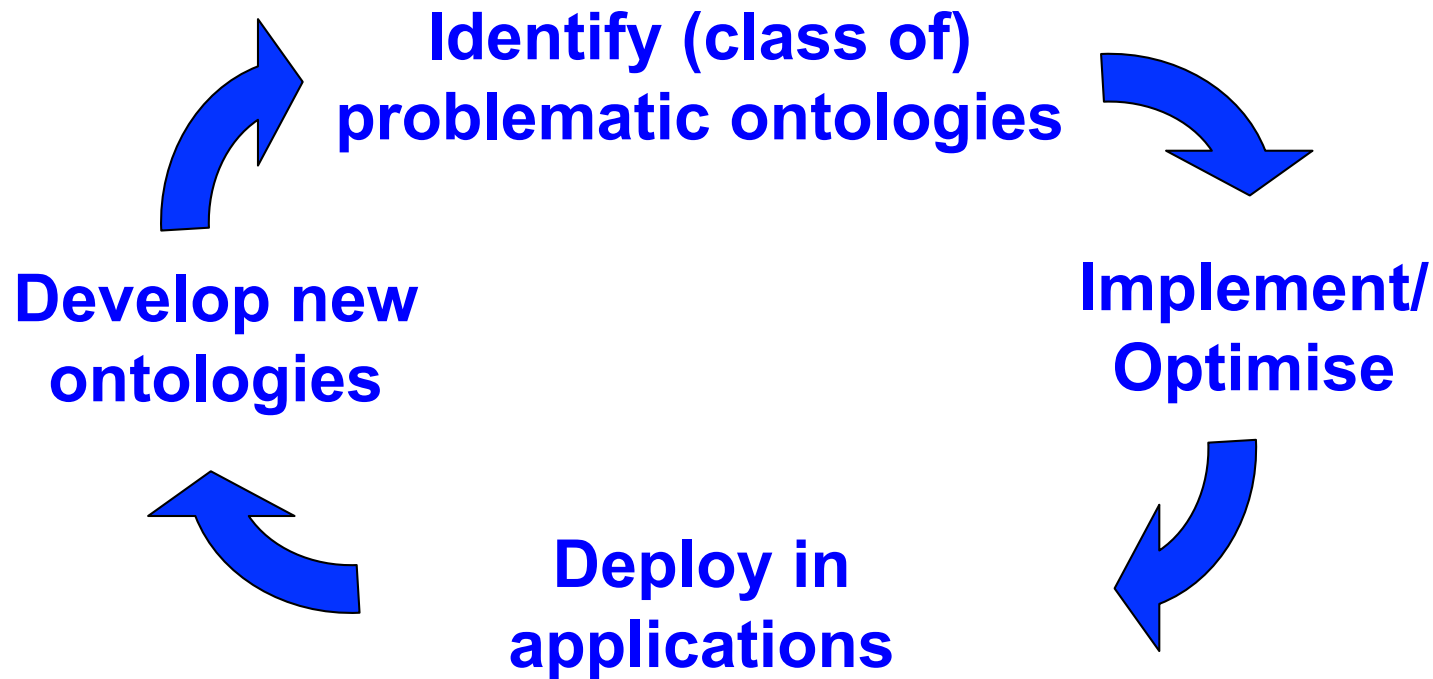


**Develop new  
ontologies**





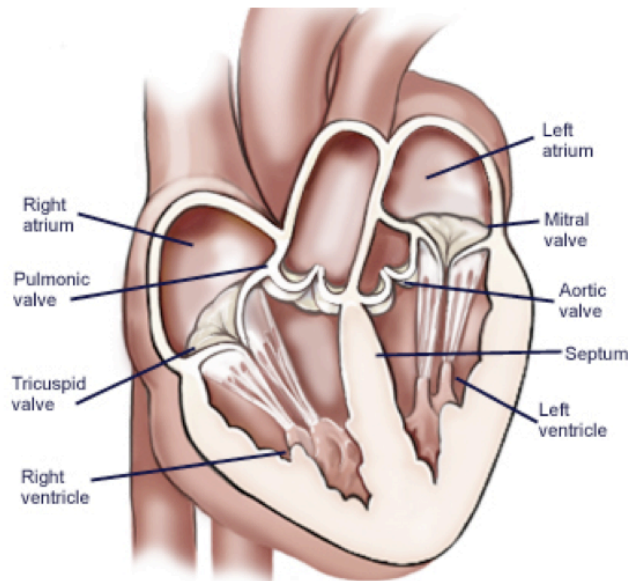
# Problem Solved?





# Scalability Issues

- Problems with very **large and/or cyclical ontologies**



LeftSide  $\sqsubseteq \exists$ hasComponent.AorticValve  
LeftSide  $\sqsubseteq \exists$ hasComponent.MitralValve  
AorticValve  $\sqsubseteq \exists$ hasConnection.LeftVentricle  
MitralValve  $\sqsubseteq \exists$ hasConnection.LeftVentricle  
LeftVentricle  $\sqsubseteq \exists$ isDivisionOf.LeftSide

- Ontologies may define 10s/100s of thousands of terms
- Can lead to construction of *very* large models







# Scalability Issues

- Problems with **large data sets** (ABoxes)
  - Main reasoning problem is (conjunctive) query answering, e.g., retrieve all patients suffering from vascular disease:  
 $Q(x) \leftarrow \text{Patient}(x) \wedge \text{suffersFrom}(x, y) \wedge \text{VascularDisease}(y)$
  - Decidability still open for OWL, although minor restrictions (on cycles in non-distinguished variables) restore decidability
  - Query answering reduced to standard decision problem, e.g., by checking for each individual  $x$  if  $\mathcal{O} \models Q(x)$
  - Model construction starts with *all* ground facts (data)
- Typical applications may use data sets with **10s/100s of millions** of individuals (or more)





# OWL 2

- **New version** of OWL became a rec in October 2009
- **Extends OWL** with a small but useful set of features
  - That are needed in applications
  - For which semantics and reasoning techniques well understood
  - That tool builders are willing and able to support
- Adds **profiles**
  - Language subsets with useful computational properties





# New Language Features

Four kinds of new feature:

- **Increased expressive power**
  - qualified cardinality restrictions, e.g.:  
persons having two friends **who are republicans**
  - property **chains**, e.g.:  
the **brother of your parent** is your uncle
  - **local reflexivity** restrictions, e.g.:  
narcissists love **themselves**
  - **reflexive, irreflexive, and asymmetric** properties, e.g.:  
nothing can be a **proper part of itself** (irreflexive)
  - **disjoint** properties, e.g.:  
you can't be both the **parent of and child of** the same person
  - **keys**, e.g.:  
country + license plate constitute a **unique identifier** for vehicles





# New Language Features

Four kinds of new feature:

- **Extended Datatypes**

- Much wider range of **XSD Datatypes** supported, e.g.:  
Integer, string, boolean, real, decimal, float, datatype, ...
- User-defined datatypes using **facets**, e.g.:



max weight of an airmail letter:  
`xsd:integer maxInclusive "20"^^xsd:integer`



format of Italian registration plates:  
`xsd:string xsd:pattern "[A-Z]{2} [0-9]{3}[A-Z]{2}"`





# New Language Features

Four kinds of new feature:

- **Metamodelling and annotations**
  - Restricted form of metamodelling via “punning”, e.g.:
    - `SnowLeopard` subClassOf BigCat (i.e., a **class**)
    - `SnowLeopard` type EndangeredSpecies (i.e., an **individual**)
  - Annotations of axioms as well as entities, e.g.:
    - `SnowLeopard` type EndangeredSpecies (“**source: WWF**”)
  - Even annotations of annotations





# New Language Features

Four kinds of new feature:

- **Syntactic sugar**

- Disjoint unions, e.g.:

Element is the **DisjointUnion** of Earth Wind Fire Water

i.e., Element is equivalent to the union of Earth Wind Fire Water

Earth Wind Fire Water are pair-wise disjoint

- Negative assertions, e.g.:

Mary **is not** a sister of Ian

21 **is not** the age of Ian 😞





# Alternative Syntaxes

- Normative exchange syntax is **RDF/XML**

```
<owl:Class rdf:about="#Heart">
  <owl:equivalentClass>
    <owl:Class>
      <owl:intersectionOf rdf:parseType="Collection">
        <rdf:Description rdf:about="#MuscularOrgan"/>
        <owl:Restriction>
          <owl:onProperty rdf:resource="#isPartOf"/>
          <owl:someValuesFrom rdf:resource="#CirculatorySystem"/>
        </owl:Restriction>
      </owl:intersectionOf>
    </owl:Class>
  </owl:equivalentClass>
  <rdfs:subClassOf rdf:resource="&owl;Thing"/>
</owl:Class>
```



# Alternative Syntaxes

- Normative exchange syntax is **RDF/XML**
- **Functional syntax** mainly intended for language spec

```
EquivalentClasses(Heart  
  ObjectIntersectionOf(ObjectSomeValuesFrom(isPartOf CirculatorySystem)  
    MuscularOrgan))
```







# Alternative Syntaxes

- Normative exchange syntax is **RDF/XML**
- **Functional syntax** mainly intended for language spec
- **XML syntax** for interoperability with XML toolchain

```
<EquivalentClasses>
  <Class URI="Heart"/>
  <ObjectIntersectionOf>
    <Class URI="MuscularOrgan"/>
    <ObjectSomeValuesFrom>
      <ObjectProperty URI="isPartOf"/>
      <Class URI="CirculatorySystem"/>
    </ObjectSomeValuesFrom>
  </ObjectIntersectionOf>
</EquivalentClasses>
```



# Alternative Syntaxes

- Normative exchange syntax is **RDF/XML**
- **Functional syntax** mainly intended for language spec
- **XML syntax** for interoperability with XML toolchain
- **Manchester syntax** for better readability

Class:Heart

EquivalentTo:MuscularOrgan

that isPartOf CirculatorySystem





# Profiles

- OWL 2 defines three **profiles**:
  - **EL**: polynomial time reasoning for schema and data
  - **QL**: logspace query answering using RDBMs
  - **RL**: polynomial time query answering using rule-extended DBs
- OWL defined only one profile: **OWL Lite**
  - DL research not consulted in design of OWL Lite
  - resulting “fragment” not in fact very Lite (EXPTIME-complete)





# OWL 2 EL

- A (near maximal) fragment of OWL 2 such that
  - satisfiability checking is in PTime (**PTime-Complete**)
  - data complexity of query answering also PTime-Complete





# OWL 2 EL

- A (near maximal) fragment of OWL 2 such that
  - satisfiability checking is in PTime (**PTime-Complete**)
  - data complexity of query answering also PTime-Complete
- Based on  $\mathcal{EL}$  family of description logics





# OWL 2 EL

- A (near maximal) fragment of OWL 2 such that
  - satisfiability checking is in PTime (**PTime-Complete**)
  - data complexity of query answering also PTime-Complete
- Based on  $\mathcal{EL}$  family of description logics
- Efficient **saturation** based algorithms
  - derive axioms rather than constructing models, e.g.:

$$\frac{A \sqsubseteq B \quad B \sqsubseteq C}{A \sqsubseteq C} \qquad \frac{A \sqsubseteq B \quad A \sqsubseteq C \quad B \sqcap C \sqsubseteq D}{A \sqsubseteq D}$$

$$\frac{A \sqsubseteq \exists R.B \quad B \sqsubseteq C \quad \exists R.C \sqsubseteq D}{A \sqsubseteq D}$$



# OWL 2 QL

- A (near maximal) fragment of OWL 2 such that
  - data complexity of conjunctive query answering in **AC<sup>0</sup>**
- Based on **DL-Lite** family of description logics
- Efficient **query rewriting** based algorithms
  - ontology axioms used as rewrite rules for query, e.g.:

$$Q(x) \leftarrow \text{treats}(x, y) \wedge \text{Patient}(y)$$

$$Q(x) \leftarrow \text{Doctor}(x)$$

$$Q(x) \leftarrow \text{Consultant}(x)$$

$\text{Doctor} \sqsubseteq \exists \text{treats.Patient}$
$\text{Consultant} \sqsubseteq \text{Doctor}$

- data storage & evaluation of resulting UCQ delegated to RDBMS

$$Q(x) \leftarrow (\text{treats}(x, y) \wedge \text{Patient}(y)) \vee \text{Doctor}(x) \vee \text{Consultant}(x)$$



# Profiles as Optimisations

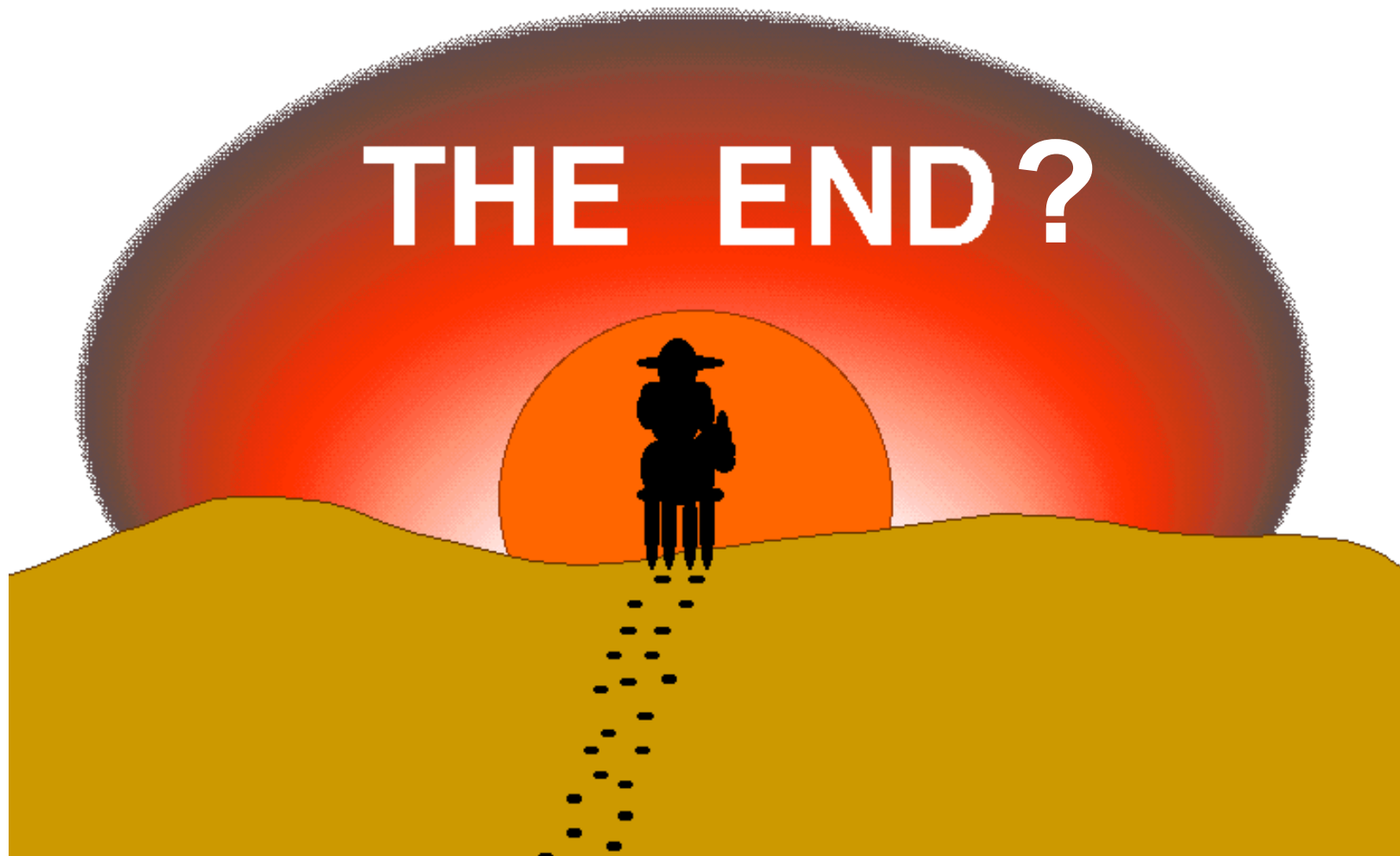
- **EL techniques** as optimisation for OWL classification
  - use saturation algorithm to classify part of ontology
  - use incremental reasoning techniques to add remaining axioms
  - similar optimisation already used to good effect in FaCT++ (can classify extended SNOMED-OWL in 24 minutes)
- **QL techniques** as optimisation for EL query answering
  - in “hybrid” approach, data first extended by partially materialising EL inferences
  - then use modified query rewriting with ontology and extended data







**THE END?**





# Ongoing Research

- Query answering
  - [Kontchakov et al], [Konev et al], [Baader et al], [Glimm et al]
- Diagnosis and repair
  - [Peñaloza et al]
- Reasoning over hidden content
  - [Cuenca Grau et al]
- Probabilistic DLs
  - [Lutz et al]





# Ongoing Research

- Optimisation
- Second order DLs
- Temporal DLs
- Fuzzy/rough concepts
- Modularity, alignment and integration
- Integrity constraints
- ...





# Ongoing Standardisation Efforts

- Standardised query language
  - SPARQL standard for RDF
  - Currently being extended for OWL, see <http://www.w3.org/TR/sparql11-entailment/>
- RDF
  - Revision currently being considered, see <http://www.w3.org/2009/12/rdf-ws/>



# The 9<sup>th</sup> International Semantic Web Conference

Shanghai International Convention Center, Shanghai, China

Nov 7<sup>th</sup> - 11<sup>th</sup>, 2010

<http://iswc2010.semanticweb.org>

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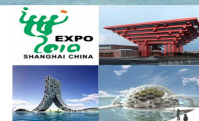
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*Stunning Venue*



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- Boris Motik
- Yevgeny Kazakov
- Héctor Pérez-Urbina
- Rob Shearer
- Bernardo Cuenca Grau
- Birte Glimm



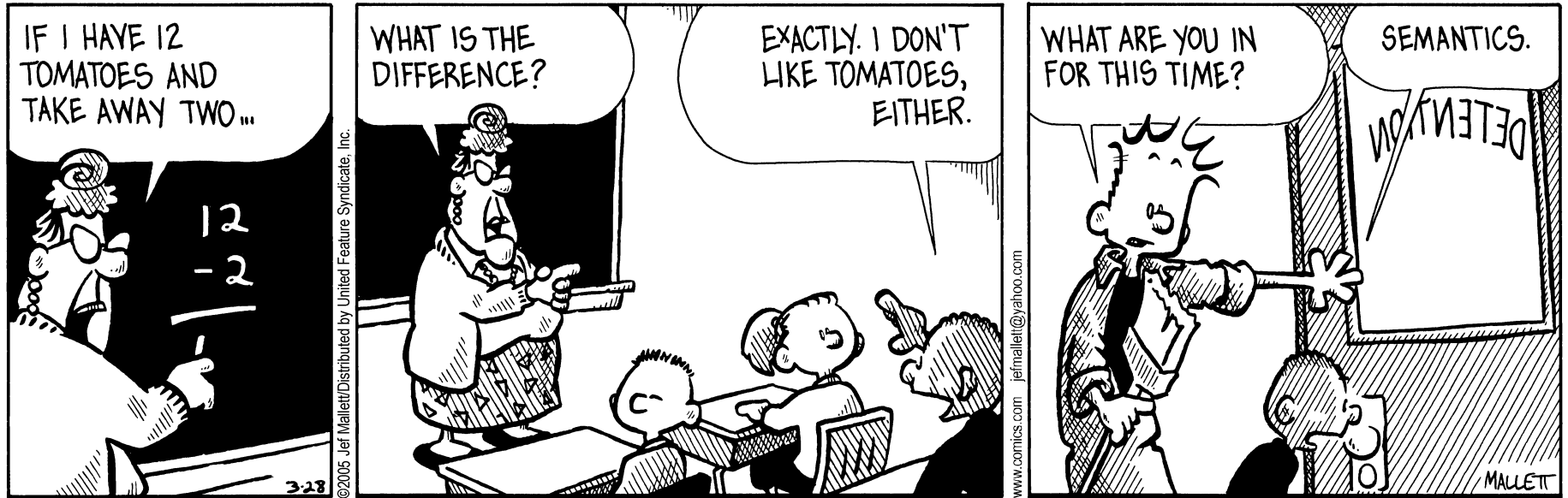


Thank you for listening





# Thank you for listening



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# Any questions?

