# **Complexity of Ontology engineering** Ontology engineering tasks: **OWL** Tutorial • design evolution **Reasoning Services** • inter-operation and Integration Reasoning services help knowledge engineers and users to build and use ontologies deployment Further complications are due to (Many of the following slides have been taken from a longer tutorial on Logical Foundations for the Semantic Web by Ian Horrocks and Ulrike Sattler' • sheer size of ontologies • number of persons involved users not being knowledge experts natural laziness • etc.

## Reasoning Services: what we might want in the Design Phase

- be warned when making meaningless statements
- **test satisfiability** of defined concepts

 $\mathsf{SAT}(C,\mathcal{T})$  iff there is a model  $\mathcal{I}$  of  $\mathcal{T}$  with  $C^{\mathcal{I}} \neq \emptyset$ 

unsatisfiable, defined concepts are signs of faulty modelling

- see consequences of statements made
- test defined concepts for subsumption

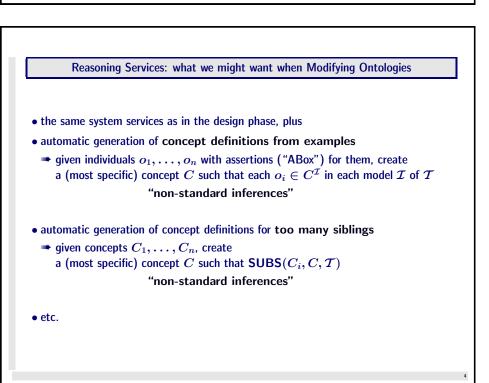
 $\mathsf{SUBS}(C,D,\mathcal{T}) \text{ iff } C^{\mathcal{I}} \subseteq D^{\mathcal{I}} \text{ for all model } \mathcal{I} \text{ of } \mathcal{T}$ 

unwanted or missing subsumptions are signs of imprecise/faulty modelling

- see redundancies
- test defined concepts for equivalence

 $\mathsf{EQUIV}(C,D,\mathcal{T}) \text{ iff } C^{\mathcal{I}} = D^{\mathcal{I}} \text{ for all model } \mathcal{I} \text{ of } \mathcal{T}$ 

knowing about "redundant" classes helps avoid misunderstandings



Reasoning Services: what we might want when Integrating and Using Ontologies

#### For integration:

- the same system services as in the design phase, plus
- the possibility to abstract from concepts to patterns and compare patterns
- $\blacksquare$  e.g., compute those concepts D defined in  $\mathcal{T}_2$  such that

 $\mathsf{SUBS}(\mathtt{Human} \sqcap (\forall \mathtt{child.}(X \sqcap \forall \mathtt{child.}Y)), D, \mathcal{T}_1 \cup T_2)$ 

"non-standard inferences"

When using ontologies:

- the same system services as in the design phase and the integration phase, plus
- automatic classification of indidivuals
- $\blacksquare$  given individual o with assertions, return all defined concepts D such that

 $o \in D^{\mathcal{I}}$  for all models  $\mathcal{I}$  of  $\mathcal{T}$ 

Do Reasoning Services need to be Decidable?

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We know SAT is reducible to co-SUBS and vice versa
Hence SAT is undecidable iff SUBS is
SAT is semi-decidable iff co-SUBS is
If SAT is undecidable but semi-decidable, then
there exists a complete SAT algorithm:
SAT(C, T) ⇔ "satisfiable", but might not terminate if not SAT(C, T)
there is a complete co-SUBS algorithm:
SUBS(C, T) ⇔ "subsumption", but might not terminate if SUBS(C, D, T))
1. Do expressive ontology languages exist with decidable reasoning problems?
Yes: DAML+OIL and OWL DL
2. Is there a practical difference between ExpTime-hard and non-terminating?
let's see
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Reasoning Services: what we can do

(many) reasoning problems are inter-reducible:

 $\mathsf{EQUIV}(C, D, \mathcal{T})$  iff  $\mathsf{sub}(C, D, \mathcal{T})$  and  $\mathsf{sub}(D, C, \mathcal{T})$ 

SUBS(C, D, T) iff not  $SAT(C \sqcap \neg D, T)$ 

SAT(C, T) iff not  $SUBS(C, A \sqcap \neg A, T)$ 

SAT(C, T) iff  $cons({o: C}, T)$ 

**In the following, we concentrate on** SAT(C, T)

**Relationship with other Logics** 

• SHI is a fragment of first order logic

- $\mathcal{SHIQ}$  is a fragment of first order logic with counting quantifiers equality
- $\bullet$   $\mathcal{SHI}$  without transitivity is a fragment of first order with two variables
- *ALC* is a notational variant of the multi modal logic K inverse roles are closely related to converse/past modalities transitive roles are closely related to transitive frames/axiom 4 number restrictions are closely related to deterministic programs in PDL

# Deciding Satisfiability of $\mathcal{SHIQ}$

Remember: SHIQ is OWL DL without datatypes and nominals

Next: tableau-based decision procedure for SAT (C, T)

The algorithm proceeds by trying to construct a representation of a model  $\mathcal{I}$  for CThis can be done because there always is such a representation, and the representation is at most of size exponential in the size of the ontology Complexity of DLs: Summary

Deciding satisfiability (or subsumption) of

		without	w.r.t.
concepts in	Definition	a TBox is	a TBox is
ALC	$\sqcap$ , $\sqcup$ , $\neg$ , $\exists R.C$ , $\forall R.C$ ,	PSpace-c	ExpTime-c
8	$\mathcal{ALC}$ + transitive roles	PSPace-c	ExpTime-c
$\mathcal{SI}$	$\mathcal{SI}$ + inverse roles	PSPace-c	ExpTime-c
SH	S + role hierarchies	ExpTime-c	ExpTime-c
SHIQ	$\mathcal{SHI}$ + number restrictions	ExpTime-c	ExpTime-c
SHIQO	$\mathcal{SHI}$ + nominals	NExpTime-c?	NExpTime-o
$\mathcal{SHIQ}^+$	$\mathcal{SHIQ}$ + "naive number restrictions"	undecidable	undecidable
$\mathcal{SH}^+$	SH + "naive role hierarchies"	undecidable	undecidable

Complexity of SHIQ (Roughly OWL Lite)

SHIQ is ExpTime-hard because ALC with TBoxes is and SHIQ can internalise TBoxes: polynomially reduce SAT(C, T) to  $SAT(C_T, \emptyset)$ 

 $C_{\mathcal{T}} := \ C \sqcap \bigcap_{C_i \stackrel{i}{\sqsubseteq} D_i \in \mathcal{T}} (C_i \Rightarrow D_i) \sqcap \forall U. \prod_{C_i \stackrel{i}{\sqsubseteq} D_i \in \mathcal{T}} (C_i \Rightarrow D_i)$ 

for U new role with trans(U), and

 $R \stackrel{.}{\sqsubseteq} U, R^- \stackrel{.}{\sqsubseteq} U$  for all roles R in  $\mathcal T$  or C

Lemma: C is satisfiable w.r.t.  $\mathcal{T}$  iff  $C_{\mathcal{T}}$  is satisfiable

Why is SHIQ in ExpTime?

Tableau algorithms runs in worst-case non-deterministic double exponential space using double exponential time....

 $\mathcal{SHIQ}$  is in ExpTime

Translation of  $\mathcal{SHIQ}$  into Büchi Automata on infinite trees

 $C, \mathcal{T} \rightsquigarrow A_{C,\mathcal{T}}$ 

## such that

- 1.  $\mathsf{SAT}(C, \mathcal{T})$  iff  $L(A_{C, \mathcal{T}}) \neq \emptyset$
- 2. |A<sub>C,T</sub>| is exponential in |C| + |T|
  (states of <sub>C,T</sub> are sets of subconcepts of C and T)

This yields ExpTime decision procedure for SAT(C, T) since emptyness of L(A) can be decided in time polynomial in |A|

**Problem**  $A_{C,T}$  needs (?) to be constructed before being tested: best-case ExpTime

## $\mathcal{SHIQO}$ (roughly OWL DL) is NExpTime-hard

Fact: for SHIQ and SHOQ, SAT(C, T) are ExpTime-complete

 ${\mathcal I}$  stands for "with inverse roles",  ${\mathcal O}$  " for "with nominals"

Lemma: their combination is NExpTime-hard even for  $\mathcal{ALCQIO}$ , SAT $(C, \mathcal{T})$  is NExpTime-hard

## Missing in $\mathcal{SHIQ}$ from OWL DL: Datatypes and Nominals

(Remember:  $\mathcal{I}$  stands for "with inverse roles",  $\mathcal{O}$ " for "with nominals")

So far, we discussed DLs that are fragments of OWL DL

SHIQ + Nominals = SHIQO

- we have seen: SHIQO is NExpTime-hard
- so far: no "goal-directed" reasoning algorithm known for  $\mathcal{SHIQO}$
- unclear: whether SHIQO is "practicable"
- but: t-algorithm designed for  $\mathcal{SHOQ}$
- live without nominals or inverses

SHIQ + Datatypes =  $SHIQ(D_n)$ SHOQ + Datatypes =  $SHOQ(D_n)$ 

- extend  $\mathcal{SH}?\mathcal{Q}$  with concrete data and built-in predicates
- extend SH?Q with, e.g.,  $\exists age. > 18 \text{ or}$  $\exists age, shoeSize. =$
- relevant in many ontologies
- dangerous, but well understood extension
- currently being implemented and tested for  $\mathcal{SHOQ}$  (D)

## Implementing OWL Lite or OWL DL

Naive implementation of  $\mathcal{SHIQ}$  tableau algorithm is doomed to failure:

Construct a tree of exponential depth in a non-deterministic way → requires backtracking in a deterministic implementation

## Optimisations are crucial

A selection of some vital optimisations: Classification: reduce number of satisfiability tests when classifying TBox Absorption: replace globally disjunctive axioms by local versions Optimised Blocking: discover loops in proof process early Backjumping: dependency-directed backtracking SAT optimisations: take good ideas from SAT provers

Missing in SHIQ from OWL DL: Datatypes

- In DLs, datatypes are known as concrete domains
- Concrete domain D + (dom(D), pred) consists of
- a set dom(D), e.g., integers, strings, lists of reals, etc.
- a set pred of predicates, each predicate  $P \in$  pred comes with
  - arity  $n \in \mathbb{N}$  and
  - a (fixed!) extension  $P^n \subseteq \mathsf{dom}(D)^n$
- e.g. predicates on  $\mathbb{Q}$ : unary  $=_3$ ,  $\leq_7$ , binary  $\leq$ , =, ternary  $\{(x, y, z) \mid x + y = y\}$

## Summing up: SAT and SUBS in OWL DL

#### We know

- how to reason in *SHIQ* (proven to be ExpTime-complete) implementations and optimisations well understood
- how to reason in SHOQ(D) (decidable, exact complexity unknown) optimisation for nominals O need more investigations optimisation for (D) are currently being investigated
- that their combination, OWL DL<sup>1</sup>, is more complex: NExpTime-hard so far, no "goal-directed" reasoning algorithm known for OWL DL
- accept an incomplete algorithm for OWL DL
- we use a first-order prover for reasoning (and accept possibility of non-termination)
- me live with OWL Lite while waiting for complete OWL DL algorithm

1.  $\mathcal{SHIQO}(D)$  with number restrictions restricted to  $\geqslant nR.\top$ ,  $\leqslant nR.\top$ 

**ABoxes and Instances** 

How to decide whether Cons(A, T)?

ightarrow extend tableau algorithm to start with ABox  $C(a) \in A \Rightarrow C \in \mathcal{L}(a)$ 

 $R(a,b) \in A \Rightarrow (a,R,y)$ 

this yields a graph—in general, not a tree

work on forest—rather than on a single tree

i.e., trees whose root nodes intertwine in a graph

theoretically not too complicated

many problems in implementation

Current Research: how to provide ABox reasoning for huge ABoxes approach: restrict relational structure of ABox **ABoxes and Instances** 

Remember: when using ontologies, we would like to automatically classify individuals described in an ABox

an ABox Ais a finite set of assertions of the form

C(a) or R(a,b)

 $\mathcal I$  is a model of A if  $a^{\mathcal I} \in C^{\mathcal I}$  for each  $C(a) \in A$  $(a^{\mathcal I}, b^{\mathcal I}) \in R^{\mathcal I}$  for each  $R(a, b) \in A$ 

 $\mathsf{Cons}(A,\mathcal{T})$  if there is a model  $\mathcal{I}$  of Aand  $\mathcal{T}$ 

 $\mathsf{Inst}(a,C,A,\mathcal{T})$  if  $a^{\mathcal{I}}\in C^{\mathcal{I}}$  for each model  $\mathcal{I}$  of Aand  $\mathcal{T}$ 

Easy: Inst(a, C, A, T) iff not  $Cons(A \cup \{\neg C(a)\}, T)$ 

Example: $A = \{A(a), R(a, b), A(b), S(b, c), B(c)\}$  $\mathcal{T} = \{A \sqsubseteq \leq 1R. \top\}$  $\mathsf{Inst}(a, \forall R.A, A, \mathcal{T})$  but not  $\mathsf{Inst}(b, \forall S.B, A, \mathcal{T})$ 

Non-Standard Reasoning Services

For Ontology Engineering, useful reasoning services can be based on SAT and SUBS

Are all useful reasoning services based on SAT and SUBS?

Remember: to support modifying ontologies, we wanted

- automatic generation of concept definitions from examples
- in given ABox Aand individuals  $a_i$  create a (most specific) concept C such that each  $a_i \in C^{\mathcal{I}}$  in each model  $\mathcal{I}$  of  $\mathcal{T}$  $\mathsf{msc}(a_1, \ldots, a_n), A, \mathcal{T})$
- automatic generation of concept definitions for too many siblings
- $\blacksquare$  given concepts  $C_1, \ldots, C_n$ , create
  - a (most specific) concept C such that  $\mathsf{SUBS}(C_i, C, \mathcal{T})$

$$\mathsf{lcs}(C_1,\ldots,C_n),A,\mathcal{T})$$



Unlike SAT, SUBS, etc., msc and lcs are computation problems

Fix a DL  $\mathcal{L}$ . Define  $C = \mathsf{msc}(a_1, \ldots, a_n, A, \mathcal{T})$  iff  $a_i^{\mathcal{I}} \in C^{\mathcal{I}} \ \forall 1 \leq i \leq n$  and  $\forall \ \mathcal{I}$  model of Aand  $\mathcal{T}$ C is the smallest such concept, i.e., if  $a_i^{\mathcal{I}} \in {C'}^{\mathcal{I}} \ \forall 1 \leq i \leq n$  and  $\forall \ \mathcal{I}$  model of Aand then SUBS(C, C', T) $C = \mathsf{lcs}(C_1, \ldots, C_n, \mathcal{T})$  iff  $\mathsf{SUBS}(C_i, C, \mathcal{T}) \ \forall 1 \le i \le n$ C is the smallest such concept, i.e., if  $C_i \in C' \ \forall 1 \leq i \leq n$ then SUBS(C, C', T)Clear:  $\mathsf{msc}(a_1,\ldots,a_n,A,\mathcal{T}) = \mathsf{lcs}(\mathsf{msc}(a_1,A,\mathcal{T}),\ldots,\mathsf{msc}(a_n,A,\mathcal{T}))$  $lcs(C_1, C_2, C_3, T) = lcs(lcs(C_1, C_2, T), C_3, T))$ 

Non-Standard Reasoning Services: other

concept pattern: concept with variabels in the place of concepts

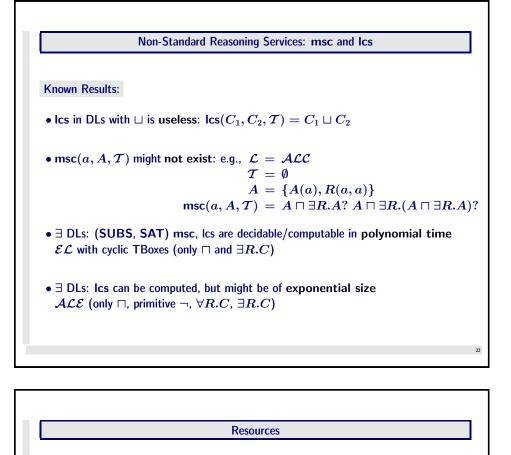
The following non-standard reasoning services also come w.r.t. TBoxes

unification:  $C \equiv^{?} D$  for C. D concept patterns solution to  $C \equiv^? D$ : a substitution  $\sigma$  (replacing variables with concepts) such that  $\sigma(C) \equiv \sigma(D)$ Goal: decide unification problem and find a (most specific) such substitution

matching:  $C \equiv^? D$  for C concept patterns and D a concept solution to  $C \equiv^{?} D$ : a substitution  $\sigma$  with  $\sigma(C) \equiv D$ 

approximation: given DLs  $\mathcal{L}_1$ ,  $\mathcal{L}_2$  and  $\mathcal{L}_1$ -concept C, find  $\mathcal{L}_2$ -concept  $\hat{C}$  with SUBS $(C, \hat{C})$  and SUBS(C, D) implies  $SUBS(\hat{C}, D)$  for all  $\mathcal{L}_2$ -concepts D

rewriting given  $C, \mathcal{T}$ , find "shortest"  $\hat{C}$  such that EQUIV $(C, \hat{C}, \mathcal{T})$ 



ESSLI Tutorial by Ian Horrocks and Ulrike Sattler http://www.cs.man.ac.uk/\~horrocks/ESSLI203/

W3C Webont Working Group Documents http://www.w3.org/2001/sw/WebOnt/ Particularly OWL Web Ontology Language Guide http://www.w3.org/TR/owl-guide/

W3C RDF Core Working Group Documents http://www.w3.org/2001/sw/RDFCore/ Particularly RDF Primer http://www.w3.org/TR/rdf-primer/

Description Logics Handbook http://books.cambridge.org/0521781760.htm

RDF and OWL Tutorials by Roger Costello and David Jacobs http:/www.xfront.com/rdf/ http:/www.xfront.com/rdf-schema/ http:/www.xfront.com/owl-quick-intro/ http:/www.xfront.com/owl/