

Principles of Knowledge Representation and Reasoning

Semantic Networks and Description Logics V:
Description Logics – Decidability and Complexity

Bernhard Nebel, Stefan Wölfl, and Felix Lindner

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Decidability

L_2 is the fragment of first-order predicate logic using only two different variable names (**note**: variable names can be reused!).

$L_2^=$: L_2 plus equality.

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Corollary

Subsumption and satisfiability of concept descriptions is decidable in description logics using only the following concept and role forming operators: $C \sqcap D$, $C \sqcup D$, $\neg C$, $\forall r.C$, $\exists r.C$, $r \sqsubseteq s$, $r \sqcap s$, $r \sqcup s$, $\neg r$, r^{-1} .

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Potential problems: Role composition and cardinality restrictions for role fillers. Cardinality restrictions, however, are not a real

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Undecidability

- $r \circ s, r \sqcap s, \neg r, 1$ [Schild 88]
... already shown by Tarski (for relation algebras)

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Undecidability

- $r \circ s, r \sqcap s, \neg r, 1$ [Schild 88]
... already shown by Tarski (for relation algebras)
- $r \circ s, r \dot{=} s, C \sqcap D, \forall r.C$ [Schmidt-Schauß 89]
... This is, in fact, a fragment of the early description logic **KL-ONE**, where people had hoped to come up with a complete subsumption algorithm

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Decidable, polynomial-time cases

- \mathcal{FL}^- has obviously a polynomial subsumption problem (in the empty TBox) – the SUB algorithm needs only quadratic time.

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$$C := A \mid \neg A \mid \top \mid \perp \mid C \sqcap C' \mid \forall r.C \mid (\geq nr) \mid (\leq nr),$$
$$r := t \mid r^{-1}$$

and

$$C := A \mid C \sqcap C' \mid \forall r.C \mid \exists r$$
$$r := t \mid r^{-1} \mid r \sqcap r' \mid r \circ r'$$

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How hard is \mathcal{ALC} subsumption?

Proposition

\mathcal{ALC} subsumption and unsatisfiability are co-NP-hard.

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\mathcal{ALC} subsumption and unsatisfiability are co-NP-hard.

Proof.

Unsatisfiability and subsumption are reducible to each other.

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Unsatisfiability and subsumption are reducible to each other. We give a reduction from UNSAT.

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Proof.

Unsatisfiability and subsumption are reducible to each other. We give a reduction from UNSAT. A propositional formula φ over the atoms a_i is mapped to $\pi(\varphi)$:

$$a_i \mapsto a_i$$

$$\psi \wedge \psi' \mapsto \pi(\psi) \sqcap \pi(\psi')$$

$$\psi' \vee \psi \mapsto \pi(\psi) \sqcup \pi(\psi')$$

$$\neg \psi \mapsto \neg \pi(\psi)$$

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Obviously, ϕ is satisfiable iff $\pi(\phi)$ is satisfiable (use structural induction).

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Obviously, φ is satisfiable iff $\pi(\varphi)$ is satisfiable (use structural induction). If φ has a model, construct a model for $\pi(\varphi)$ with just one element t standing for the truth of the atoms and the formula.

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Obviously, ϕ is satisfiable iff $\pi(\phi)$ is satisfiable (use structural induction). If ϕ has a model, construct a model for $\pi(\phi)$ with just one element t standing for the truth of the atoms and the formula. Conversely, if $\pi(\phi)$ satisfiable, pick one element $d \in \pi(\phi)^{\mathcal{I}}$ and set the truth value of atom a_i according to the fact that $d \in \pi(a_i)^{\mathcal{I}}$. \square

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How hard does it get?

- Is \mathcal{ALC} unsatisfiability and subsumption also **complete** for co-NP?

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How hard does it get?

- Is \mathcal{ALC} unsatisfiability and subsumption also **complete** for co-NP?
- Unlikely – since models of a single concept description can already become exponentially large!

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How hard does it get?

- Is \mathcal{ALC} unsatisfiability and subsumption also **complete** for co-NP?
- Unlikely – since models of a single concept description can already become exponentially large!
- We will show **PSPACE-completeness**, whereby hardness is proved using a complexity result for (un)satisfiability in the modal logic K .
- Satisfiability and unsatisfiability in K is PSPACE-complete.

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Reduction from K -satisfiability

Lemma (Lower bound for \mathcal{ALC})

\mathcal{ALC} subsumption, unsatisfiability and satisfiability are all PSPACE-hard.

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Extend the reduction given in the last proof by the following two rules – assuming that b is a fixed role name:

$$\Box \psi \mapsto \forall b. \pi(\psi)$$

$$\Diamond \psi \mapsto \exists b. \pi(\psi)$$

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Again, **obviously**, φ is satisfiable iff $\pi(\varphi)$ is satisfiable (again using structural induction). If φ has a Kripke model, interpret each world w as an object in the universe of discourse, that is, w is an instance of the primitive concept $\pi(a_i)$ iff a_i is true in w .

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Computational complexity of \mathcal{ALC} subsumption

Lemma (Upper Bound for \mathcal{ALC})

\mathcal{ALC} subsumption, unsatisfiability and satisfiability are all in PSPACE.

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This follows from the tableau algorithm for \mathcal{ALC} .

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Theorem (Complexity of \mathcal{ALC})

\mathcal{ALC} subsumption, unsatisfiability and satisfiability are all PSPACE-complete.

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Further consequences of the reducibility of K to \mathcal{ALC}

- In the reduction we used only **one** role symbol. Are there modal logics that would require more than one such role symbol?

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 - \rightsquigarrow The **multi-modal logic** K_n has n different Box operators \Box_i (for n different agents).
 - \rightsquigarrow \mathcal{ALC} (wrt. TBox reasoning) is a **notational variant** of K_n . [Schild, IJCAI-91]

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- Are there other modal logics that correspond to other descriptions logics?
 - ⇒ **propositional dynamic logic** (PDL), e.g., transitive closure, composition, role inverse, ...

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 - ↪ The **multi-modal logic** K_n has n different Box operators \Box_i (for n different agents).
 - ↪ \mathcal{ALC} (wrt. TBox reasoning) is a **notational variant** of K_n . [Schild, IJCAI-91]
- Are there other modal logics that correspond to other descriptions logics?
 - ↪ **propositional dynamic logic** (PDL), e.g., transitive closure, composition, role inverse, ...
- ↪ DL can be thought as fragments of **first-order predicate logic**. However, they are much more similar to **modal logics**.
- ↪ Algorithms and complexity results can be borrowed. Works also the other way around.

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Expressive power vs. complexity

- Of course, one wants to have a description logic with high **expressive power**. However, high expressive power implies usually that the **computational complexity** of the reasoning problems might also be high, e.g., \mathcal{FL}^- vs. \mathcal{ALC} .

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- Does it make sense to use languages such as \mathcal{ALC} or even extensions (corresponding to PDL) with higher complexity?

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- Does it make sense to use languages such as \mathcal{ALC} or even extensions (corresponding to PDL) with higher complexity?
- There are three approaches to this problem:
 - 1 Use only **small** description logics with **complete** inference algorithms.

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- Does it make sense to use languages such as \mathcal{ALC} or even extensions (corresponding to PDL) with higher complexity?
- There are three approaches to this problem:
 - 1 Use only **small** description logics with **complete** inference algorithms.
 - 2 Use **expressive** description logics, but employ **incomplete** inference algorithms.

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- Of course, one wants to have a description logic with high **expressive power**. However, high expressive power implies usually that the **computational complexity** of the reasoning problems might also be high, e.g., \mathcal{FL}^- vs. \mathcal{ALC} .
- Does it make sense to use languages such as \mathcal{ALC} or even extensions (corresponding to PDL) with higher complexity?
- There are three approaches to this problem:
 - 1 Use only **small** description logics with **complete** inference algorithms.
 - 2 Use **expressive** description logics, but employ **incomplete** inference algorithms.
 - 3 Use **expressive** description logics with **complete** inference algorithms.

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 - 1 Use only **small** description logics with **complete** inference algorithms.
 - 2 Use **expressive** description logics, but employ **incomplete** inference algorithms.
 - 3 Use **expressive** description logics with **complete** inference algorithms.
- For a long time, only options 1 and 2 were studied. Meanwhile, most researcher concentrate on **option 3**!

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Is subsumption in the empty TBox enough?

- We have shown that we can **reduce** concept subsumption in a given TBox to concept subsumption in the empty TBox.

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- In the following example **unfolding** leads to an exponential blowup:

$$C_1 \doteq \forall r.C_0 \sqcap \forall s.C_0$$

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- Unfolding C_n leads to a concept description with a size $\Omega(2^n)$.

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- Unfolding C_n leads to a concept description with a size $\Omega(2^n)$.
- Is it possible to **avoid** this blowup? Can we avoid exponential preprocessing?

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TBox subsumption for small languages

- **Question:** Can we decide in polynomial time **TBox subsumption** for a description logic such as \mathcal{FL}^- , for which concept subsumption in the empty TBox can be decided in polynomial time?

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- Subsumption without a TBox can be done easily, using a structural subsumption algorithm.
- Unfolding + structural subsumption gives us an **exponential** algorithm.

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Theorem (Complexity of TBox subsumption)

TBox subsumption for \mathcal{FL}_0 is NP-hard.

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Proof sketch.

We use the [NFA-equivalence problem](#), which is NP-complete for cycle-free automata and PSPACE-complete for general NFAs.

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Proof sketch.

We use the [NFA-equivalence problem](#), which is NP-complete for cycle-free automata and PSPACE-complete for general NFAs. We transform a cycle-free NFA to a \mathcal{FL}_0 -terminology with the mapping π as follows:

automaton $A \mapsto$ terminology \mathcal{T}_A

state $q \mapsto$ concept name q

terminal state $q_f \mapsto$ concept name q_f

input symbol $r \mapsto$ role name r

r -transition from q to $q' \mapsto q \dot{=} \dots \sqcap \forall r : q' \sqcap \dots$



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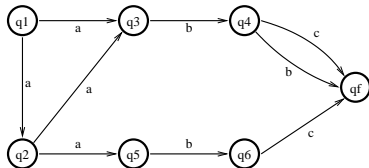
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“Proof” by example



$$q_1 \doteq \forall a. q_3 \sqcap \forall a. q_2$$

$$q_2 \doteq \forall a. q_3 \sqcap \forall a. q_5$$

$$q_3 \doteq \forall b. q_4$$

$$q_4 \doteq \forall b. q_f \sqcap \forall c. q_f$$

$$q_5 \doteq \forall b. q_6$$

$$q_6 \doteq \forall b. q_f$$

$$q_1 \equiv \forall abc. q_f \sqcap \forall abb. q_f \sqcap$$

$$\forall aabc. q_f \sqcap \forall aabb. q_f$$

$$q_2 \equiv \forall abb. q_f \sqcap \forall abc. q_f$$

$$q_1 \sqsubseteq_{\mathcal{T}} q_2 \quad \text{and} \quad \mathcal{L}(q_2) \subseteq \mathcal{L}(q_1)$$

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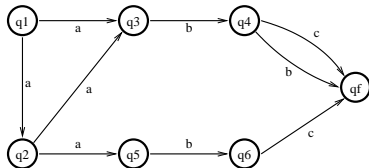
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$$q_1 \sqsubseteq_{\mathcal{T}} q_2 \quad \text{and} \quad \mathcal{L}(q_2) \subseteq \mathcal{L}(q_1)$$

In general, we have: $\mathcal{L}(q) \subseteq \mathcal{L}(q')$ iff $q' \sqsubseteq_{\mathcal{T}} q$

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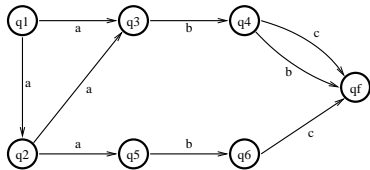
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In general, we have: $\mathcal{L}(q) \subseteq \mathcal{L}(q')$ iff $q' \sqsubseteq_{\mathcal{T}} q$, from which the **correctness of the reduction** and the **complexity result** follows.

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What does this complexity result mean?

- Note that for expressive languages such as \mathcal{ALC} , we do not notice any difference!

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- However, in order to protect oneself against such problems, one often uses **lazy unfolding** ...
- Similarly, also for \mathcal{ALC} concept descriptions, one notices that they are usually very well behaved.

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- Meanwhile, one uses complete algorithms on very large descriptions logics (e.g., **SHIQ**), e.g., in the systems **FaCT++** and **RACER**.

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- Nowadays tools can handle KBs with up to 160,000 concepts (example from **unified medical language system**) in reasonable time.
- Description logics are used as the semantic backbone for **OWL** (a Web-language extending RDF).

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