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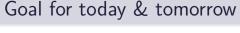
# Description Logics: a Nice Family of Logics — Complexity, Part 1 —

Thomas Schneider<sup>2</sup> Uli Sattler<sup>1</sup>

<sup>1</sup>School of Computer Science, University of Manchester, UK

<sup>2</sup>Department of Computer Science, University of Bremen, Germany

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Automated reasoning plays an important role for DLs.

- It allows the development of intelligent applications.
- The expressivity of DLs is strongly tailored towards this goal.

Requirements for automated reasoning:

- Decidability of the relevant decision problems
- Low complexity if possible
- Algorithms that perform well in practice

Yesterday & today: 1 & 3

Now: 2



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And now . . .

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## Cognitive versus Computational Complexity

Consider decision problems for reasoning, e.g.  $\mathcal{O} \models^? C \sqsubseteq D$ 

#### Cognitive complexity

(more on Friday)

- How hard is it, for a human, to decide or understand (\*)?
- interesting, little understood topic
- relevant to provide tool support for ontology engineers

#### Computational complexity

(today)

- How much time/space is needed to decide (\*)?
- interesting, well understood topic
- loads of results thanks to relationships DL FOL ML
- relevant to understand
  - trade-off: expressivity of a DL ↔ complexity of reasoning
  - whether a given algorithm is optimal/can be improved



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## Decidability

#### A (decision) problem

- ullet . . . is a subset  $P\subseteq M$
- Examples:
  - P = set of all prime numbers,  $M = \mathbb{N}$
  - $P = \text{set of triples } (\mathcal{O}, \mathcal{C}, \mathcal{D}) \text{ with } \mathcal{O} \models \mathcal{C} \sqsubseteq \mathcal{D},$  $M = \text{set of } all \text{ triples } (\mathcal{O}, \mathcal{C}, \mathcal{D}) \text{ from } \mathcal{ALC}$
- think of it as a black box:

$$m \in M$$
 Input Output  $m \in P$ ?

 $M \in P$  Output  $M \in P$   $M \in P$   $M \in P$   $M \in P$   $M \in P$ 

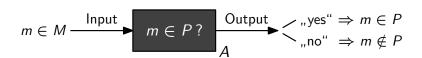
**Decidability**: *P* is decidable

if there is an algorithm A that implements the black box.

(Programming language and machine model are largely irrelevant)



## Computational complexity



#### Complexity:

measures time/space needed by A in the worst case, depending on the length of the input |m|

- Polynomial time: Number of computation steps is  $\leq pol(|m|)$ , for some polynomial function pol
- Polynomial space: Number of memory cells used is  $\leq pol(|m|)$
- Exponential time: Number of computation steps is  $\leq 2^{pol(|m|)}$
- ...



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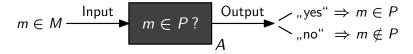
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#### Some standard complexity classes

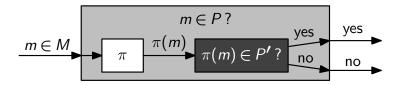
Name	Restriction	Example problem
L NL P	logarithmic space nondeterministic log. space polynomial time	graph connectivity graph accessibility prime numbers
NP PSPACE	nondeterm. polynomial time polynomial space	(propositional) SAT QBF-SAT
EXPTIME NEXPTIME EXPSPACE :	exponential time nondeterm. exponential time exponential space	CTL-SAT
	undecidable	first-order SAT

#### Reductions



A (polynomial) reduction of  $P \subseteq M$  to  $P' \subseteq M'$  is a (poly-time computable) function  $\pi : M \to M'$  with

$$m \in P$$
 iff  $\pi(m) \in P'$ 



If P reducible to P' then P is "at most as hard" as P'.

If all problems from a complexity class C are reducible to P, then P is hard for C.



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# Determining the complexity

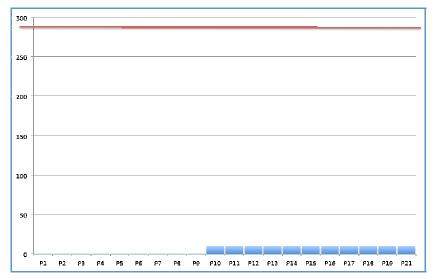
Usually one shows that a problem  $P \subseteq M$  is . . .

- in a complexity class C, by
  - designing/finding an algorithm A that solves P,
  - showing that A is sound, complete, and terminating
  - showing that A runs, for every  $m \in M$ , in at most  $\mathcal{C}$  ressources
  - $\dots$  A can be, e.g., a reduction to a problem known to be in  $\mathcal C$
- $\bullet$  hard for C, by finding
  - a suitable problem  $P' \subset M'$  that is known to be hard for C
  - and a reduction of P' to P
- complete for C, by showing that P is
  - ullet in  ${\mathcal C}$  and
  - ullet hard for  ${\cal C}$





#### Worst case: algorithm runs, for all $m \in M$ , in at most C resources, e.g., like this on all problems of size 7:





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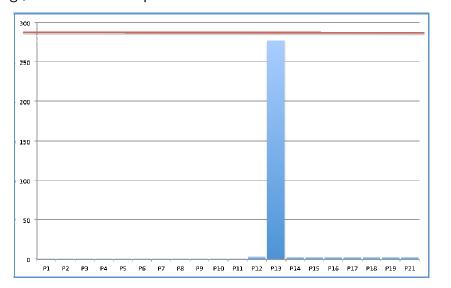
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## Worst-case complexity

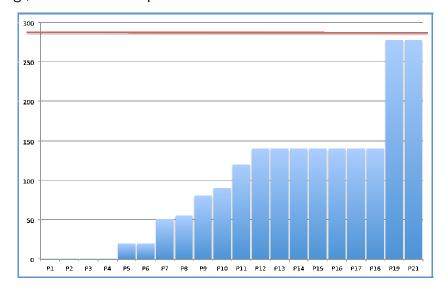
Worst case: algorithm runs, for all  $m \in M$ , in at most C resources, e.g., or like this on all problems of size 7:



# Worst-case complexity

Worst-case complexity

Worst case: algorithm runs, for all  $m \in M$ , in at most C resources, e.g., or like this on all problems of size 7:

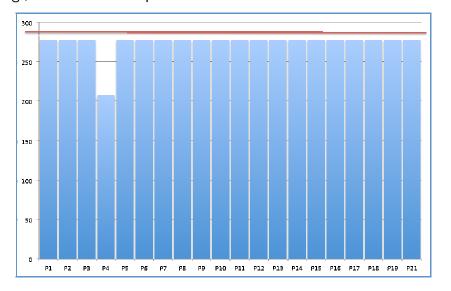




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#### Worst-case complexity

Worst case: algorithm runs, for all  $m \in M$ , in at most  $\mathcal{C}$  resources, e.g., or like this on all problems of size 7:





Known complexity results from Days 2–3

- ullet all considered reasoning problems are decidable for  $\mathcal{ALCQI}$ because the tableau algorithm is sound, complete, terminating
- consistency of  $\mathcal{ALC}$  ontologies is in ExpSpace and so are satisfiability and subsumption w.r.t. ontologies ➤ We can do better: we'll show they are ExpTime-complete
- ullet satisfiability and subsumption of  $\mathcal{ALC}$  concepts are in PSPACE
  - ➤ We cannot do better: we'll show that they are PSPACE-hard



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And now . . .

## **EXPTIME-membership**

We start with an **EXPTIME** upper bound for concept satisfiability in  $\mathcal{ALC}$  relative to TBoxes.

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## EXPTIME-membership

#### Theorem

The following problem is in **EXPTIME**.

Input: an  $\mathcal{ALC}$  concept  $C_0$  and an  $\mathcal{ALC}$  TBox  $\mathcal{T}$ Question: is there a model  $\mathcal{I} \models \mathcal{T}$  with  $\mathcal{C}^{\mathcal{I}} \neq \emptyset$ ?

We'll use a technique known from modal logic: type elimination [Pratt 1978]

The basis is a *syntactic* notion of a *type*.





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Syntactic types

General idea

We assume that

• the input concept  $C_0$  is in NNF

• the input TBox is  $\mathcal{T} = \{ \top \sqsubseteq C_{\mathcal{T}} \}$  with  $C_{\mathcal{T}}$  in NNF

Let  $\operatorname{sub}(C_0, \mathcal{T})$  be the set of subconcepts of  $C_0$  and  $C_{\mathcal{T}}$ . A type for  $C_0$  and  $\mathcal{T}$  is a subset  $t \subseteq \operatorname{sub}(C_0, \mathcal{T})$  such that

- 1.  $A \in t$  iff  $\neg A \notin t$  for all  $\neg A \in \text{sub}(C_0, T)$
- 2.  $C \sqcap D \in t$  iff  $C \in t$  and  $D \in t$  for all  $C \sqcap D \in \text{sub}(C_0, T)$
- 3.  $C \sqcup D \in t$  iff  $C \in t$  or  $D \in t$  for all  $C \sqcup D \in \text{sub}(C_0, T)$
- 4.  $C_T \in t$

Intuition:

Types describe domain elements completely, up to sub( $C_0$ , T).



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General idea of type elimination for input  $C_0$ ,  $\mathcal{T}$ :

- Generate all types for  $C_0$  and  $\mathcal{T}$  (exponentially many).
- Repeatedly eliminate types that cannot occur in any model of  $C_0$  and  $\mathcal{T}$ .
- Check whether some type containing  $C_0$  has survived.
- If yes, return "satisfiable"; otherwise "unsatisfiable".

