# Description Logics: a Nice Family of Logics — Automata-Based Decision Procedures —

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Extensions

Final remarks

### Plan for today

Yesterday, we looked at tableau-based decision procedures:

- based on the simple idea of model construction
- yield the finite model property and the tree model property
- often require hard termination proofs
- often don't yield tight upper complexity bounds

Today, we want to explore automata-based decision procedures:

- elegant and simple
- don't require termination proofs
- yield tight EXPTIME upper bounds
- are difficult to implement

Thanks to Carsten Lutz for most of the material on these slides.



DL: Automata

Extension

## Plan for today

Automata basics

### **(2)** An EXPTIME upper bound for $\mathcal{ALC}$







Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
And now			

Automata basics

### **2** An EXPTIME upper bound for $\mathcal{ALC}$

### 3 Extensions





### Automata

#### Types of automata:

- Finite automata (DFA/NFA): work on finite words
- $\omega$ -automata: work on infinite words
- Automata on finite trees
- Automata on infinite trees



 $\mathcal{ALC}$  upper bound

Extension

### Trees

#### Infinite *k*-ary tree:

- Nodes  $\in \{1, \dots, k\}^*$ :  $\varepsilon, 0, \dots, k, 00, \dots, kk, \dots$
- $\varepsilon$  denotes the root
- node n has successors n1,..., nk (ordered!)
- e.g., node 12 is the 2<sup>nd</sup>-left succ. of the 1<sup>st</sup>-left succ. of the root



k-ary M-tree T:

- nodes labelled with elements from M
- e.g.: T(12) = a

Q: 
$$T(22) = ?$$





Extensions

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## Automata and DLs

Idea for deciding satisfiability w.r.t. TBoxes:

- Choose a DL that has the tree model property (infinite trees are ok)
- Solution For concept  $C_0$  and TBox  $\mathcal{T}$ , define automaton  $\mathcal{A}(C_0, \mathcal{T})$  that accepts precisely the tree models of  $C_0$  and  $\mathcal{T}$
- ${\small \textcircled{\sc 0}}$  Check whether the language recognised by  $\mathcal{A}({\it C}_0,\mathcal{T})$  is empty

(If you don't have tree model property: try some tricks)

#### Establish EXPTIME upper bound:

- Size of  $\mathcal{A}(C_0,\mathcal{T})$  is usually exponential in the size of  $C_0$  and  $\mathcal{T}$
- Emptiness can be decided in deterministic polynomial time

Extensions

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### Looping tree automata

**LTAs** are tuples  $\mathcal{A} = (S, M, I, \Delta)$  where:

- S is a finite set of states
- *M* is an **alphabet**
- $I \subseteq Q$  is a set of initial states

i.e., every run (= computation) of  $\mathcal{A}$  starts in a state from I

- $\Delta \subseteq S \times M \times S^k$  is a transition relation
  - i.e., Δ consists of tuples (s<sub>0</sub>, a, s<sub>1</sub>,..., s<sub>k</sub>), meaning:
    "if A is in state s<sub>0</sub> and reads a in the current node's label, A next visits the k successor nodes in states s<sub>1</sub>,..., s<sub>k</sub>, resp."
  - non-deterministic choices:
     several tuples starting with the same (s<sub>0</sub>, a) are allowed

#### Language recognised by $\mathcal{A}$ : a set of k-ary M-trees

Automata basics

ALC upper bound

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## Example automaton and its runs

#### **Example:** LTA $\mathcal{A}$ on alphabet $\{a, b\}$

$S = \{s_a, t\}$	$\Delta = \{ (s_a, a, s_a, t), $
$M=\{a,b\}$	$(s_a, a, t, s_a),$
$I = \{s_a\}$	(t, a, t, t),
	(t, b, t, t)



Recognised language: all trees with infinite a-path starting at root



Extension

## Definition of a run

#### **Example:** LTA on alphabet $\{a, b\}$

$S = \{s_a, t\}$	$\Delta = \{ (s_a, a, s_a, t), $
$M = \{a, b\}$	$(s_a, a, t, s_a),$
$I = \{s_a\}$	(t, a, t, t),
	$(t, b, t, t)$ }

#### **Definition**: a **run** r of A on T

assigns to each node in  ${\mathcal T}$  a state from  ${\mathcal S}$  such that

• T's root is labelled with a state from I

• 
$$((r(n), T(n), r(n1), \ldots, r(nk)) \in \Delta$$

for all nodes  $n \in \{1, \ldots, k\}^*$ 

**Recognised language**:  $L(A) = \{T \mid \text{there is a run of } A \text{ on } T\}$ 



Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
And now			

Automata basics

### **(2)** An EXPTIME upper bound for $\mathcal{ALC}$







Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
Roadmap			

#### Goal: prove that $\mathcal{ALC}\text{-satisfiability w.r.t.}$ TBoxes is in ExpTIME

#### 2 steps:

- Represent tree interpretations as Hintikka trees
  - Tree models have labelled edges (roles), automata trees don't
  - Convenient to label nodes with *complex* concepts
- Define automaton that accepts exactly those Hintikka trees that represent models for the input concept + TBox

This reduces sat. w.r.t. TBoxes to emptiness of the automaton

Extensions

### Hintikka sets

... are used as **node labels** in Hintikka trees ( $\rightsquigarrow$  constitute set M)

Intuitively, a HS contains relevant concepts satisfied by some domain element

Definition: Let  $C_0$ ,  $\mathcal{T}$  be in NNF;  $sub(C_0, \mathcal{T}) = sub(\mathcal{T} \cup \{a : C_0\})$ (i.e.,  $sub(C_0, \mathcal{T})$  consists of all subconcepts of C, in  $\mathcal{T}$ , and of  $\neg C \sqcup D$  for each  $C \sqsubseteq D \in \mathcal{T}$ )

A Hintikka set for  $C_0$  and  $\mathcal{T}$  is a subset  $\mathcal{H} \subseteq \text{sub}(C_0, \mathcal{T})$  such that:

- (H1) If  $C \sqcap D \in \mathcal{H}$ , then  $C \in \mathcal{H}$  and  $D \in \mathcal{H}$ .
- (H2) If  $C \sqcup D \in \mathcal{H}$ , then  $C \in \mathcal{H}$  or  $D \in \mathcal{H}$ .
- (H3) For all  $C \in sub(C_0, T)$ ,  $\mathcal{H}$  does not contain C and  $\neg C$  at the same time.

(H4) If 
$$C \sqsubseteq D \in \mathcal{T}$$
, then  $\neg C \sqcup D \in \mathcal{H}$ .

 $\mathfrak{H}(\mathit{C}_{0},\mathcal{T})\text{:}$  set of all Hintikka sets for  $\mathit{C}_{0}$  and  $\mathcal{T}$ 

### Excursion: Hintikka sets vs. 1-types

#### A Hintikka set

- contains relevant concepts satisfied by some domain element
- does not need to have "full knowledge" about that element
- in particular, can be empty
- A 1-type (aka type) has stronger requirements:
  - contains all concepts satisfied by some domain element
  - thus has "full knowledge" about that domain element
  - is a subset  $t \subseteq sub(C_0, \mathcal{T})$  such that:

(T1) 
$$C \sqcap D \in t$$
 iff  $C \in t$  and  $D \in t$ .

(T2) 
$$C \sqcup D \in t$$
 iff  $C \in t$  or  $D \in t$ .

- (T3) For all  $C \in sub(C_0, T)$ ,  $C \in t$  iff  $\neg C \notin t$ .
- (T4) If  $C \sqsubseteq D \in \mathcal{T}$ , then  $\neg C \sqcup D \in t$ .



Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
Hintikka trees			

• Let k be the number of successors a domain element can be forced to have:

 $k = #\{D \in sub(C_0, \mathcal{T}) \mid D \text{ is of the form } \exists R.C\}$ 

• Hintikka sets will be k-ary  $\mathfrak{H}(C_0, \mathcal{T})$ -trees

How can we deal with the non-labelled edges?

- Intuitively, there is one **potential** successor for each  $\exists R.C$
- → The connecting role for each successor is already fixed!
  - Enumerate all concepts  $\exists R.C$  using  $E_1, \ldots, E_k$
  - If  $E_i = \exists R.C$  is ...
    - in node n's label, then the role between n and ni is R
    - not in n's label, then the connection btn. n, ni is a "dummy"



Automata basics	${\cal ALC}$ upper bound	I	Extensions	Final remarks
Example				
Let $k = 2$ d = dummy	$E_1 = \exists R.C$	$E_2 = \exists R.D$	$E_3 = \exists S.D$	
	R.C S.D	d d	d	

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Extension

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## Hintikka Trees II

Next step: describe relationship between

- the Hintikka set of each node n and
- the Hintikka sets of *n*'s successors



#### Definition:

A (k+1)-tuple of Hintikka sets  $\mathcal{H}, \mathcal{H}_1, \ldots, \mathcal{H}_k$  is matching if, for every  $i = 1, \ldots, k$  with  $E_i = \exists R. C \in \mathcal{H}$ :

(M1)  $C \in \mathcal{H}_i$  (for satisfying  $E_i$ , it suffices to consider *i*-th successor) (M2) if  $\forall R.D \in \mathcal{H}$ , then  $D \in \mathcal{H}_i$ 

Automata basics	$\mathcal{ALC}$ upper bound	Extensions	Final remarks
Hintikka Trees III			

#### Definition

A Hintikka tree for  $C_0$  and  $\mathcal{T}$  is a k-ary  $\mathfrak{H}(C_0, \mathcal{T})$ -tree such that:

(T1) 
$$C_0 \in T(\varepsilon)$$
 – i.e.,  $C_0$  is in the root's label

(T2) For every node 
$$n$$
,  
the tuple  $(T(n), T(n1), \ldots, T(nk))$  is matching.

#### Lemma

 $C_0$  is satisfiable w.r.t.  $\mathcal{T}$  iff there is a Hintikka tree for  $C_0$  and  $\mathcal{T}$ .

Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
Constructing aut	omata l		

Basic idea:

 $\bullet\,$  Use Hintikka sets as states and define  $\Delta$  such that

$$s_0 = \ell$$
 in all tuples  $(s_0, \ell, s_1, \dots, s_k) \in \Delta$   
Recall:  $\Delta \subseteq S \times M \times S^k$ 

 $\rightsquigarrow$  If there is an accepting run, it will be identical to the tree

- Use initial states to ensure that  $C_0 \in T(\varepsilon)$
- Check matching via transition relation, e.g., whenever (s<sub>0</sub>, ℓ, s<sub>1</sub>, ..., s<sub>k</sub>) ∈ Δ and E<sub>i</sub> = ∃R.C ∈ s<sub>0</sub>, then:
  (M1) C ∈ s<sub>i</sub>
  (M2) if ∀R.D ∈ s<sub>0</sub>, then D ∈ s<sub>i</sub>

Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
Constructing auto	omata II		

Automaton for  $C_0$  and  $\mathcal{T}$ :  $\mathcal{A}(C_0, \mathcal{T}) = (S, M, I, \Delta)$ , where  $S = \mathfrak{H}(C_0, \mathcal{T})$ 

$$M = \mathfrak{H}(C_0, \mathcal{T})$$
$$I = \{s \in S \mid C_0 \in s\}$$

and 
$$(s_0, \ell, s_1, \ldots, s_k) \in \Delta$$
 iff

• 
$$s_0 = \ell$$
 and

• the tuple  $(s_0, s_1, \ldots, s_k)$  is matching

#### Lemma

 $T \in L(\mathcal{A}(C_0, \mathcal{T}))$  iff T is a Hintikka tree for  $C_0$  and  $\mathcal{T}$ .



Extension

### Results

Size of  $A(C_0, T)$ : Let  $|C_0, T| = |C_0| + |T|$ .

Number of Hintikka sets exponential in  $|C_0, \mathcal{T}|$ 

$$\Rightarrow$$
  $|Q|$ ,  $|I|$ ,  $|M|$  exponential in  $|C_0, \mathcal{T}|$ 

 $\Rightarrow \ |\Delta| \ \text{exponential in} \ |C_0, \mathcal{T}| \qquad \text{since} \ |\Delta| = |M| \cdot |S|^{k+1}$ 

 $\Rightarrow \text{ Size of } \mathcal{A}(\mathit{C}_0, \mathcal{T}) \text{ exponential in } |\mathit{C}_0, \mathcal{T}|$ 

Decision procedure for  $\mathcal{ALC}$ -concept satisfiability w.r.t. TBoxes:

- Given  $C_0, \mathcal{T}$ , construct  $\mathcal{A}(C_0, \mathcal{T})$  in time exp. in  $|C_0, \mathcal{T}|$
- 2 Test emptiness of  $\mathcal{A}(C_0, \mathcal{T})$  in time polynomial in  $|\mathcal{A}(C_0, \mathcal{T})|$

#### Theorem

 $\mathcal{ALC}\text{-}\mathsf{concept}$  satisfiability w.r.t. TBoxes is in ExpTIME.

Complexity bound is optimal:  $\mathcal{ALC}$  with TBoxes is ExpTIME-hard.



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## Emptiness problem of looping automata

Determine in |S| rounds the set of **blocking** states  $B \subseteq S$ :

• Initialisation:

Set 
$$B_0 \leftarrow \{s \in S \mid \text{there is no } (s, a, s_1, \dots, s_k) \in \Delta\}$$

• Round *i*:

Set 
$$B_i \leftarrow B_{i-1} \cup \{s \in S \mid \text{for all } (s, a, s_1, \dots, s_k) \in \Delta$$
  
there is  $1 \leq i \leq k$  with  $s_i \in B_{i-1}\}$ 

• Set 
$$B = B_{|S|}$$

#### Lemma

$$L(\mathcal{A}) = \emptyset$$
 iff  $I \subseteq B$ .

Computation of B is clearly in polynomial time.



Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
And now			

Automata basics

**2** An EXPTIME upper bound for  $\mathcal{ALC}$ 







## Transfer to the other standard reasoning problems

The procedure shown can be applied to decide ....

TBox Consistency. These are equivalent:

- ${\mathcal T}$  is consistent
- some  $\mathit{fresh}^1$   $C_0$  is satisfiable w.r.t.  $\mathcal T$

Consistency of ontologies. Transform  $(\mathcal{T}, \mathcal{A})$  into  $(\mathcal{T}', \mathcal{A}')$ , where

- $\mathcal{A}'$  consists of a single concept assertion  $a: C_0$
- $\bullet$  but  $\mathcal{T'}$  is in  $\mathcal{ALCIF}_{\mathsf{reg}}$

Then test satisfiability of  $(C_0, \mathcal{T}')$ with the decision procedure extended to  $\mathcal{ALCIF}_{reg}$ 

#### Other reasoning problems: as shown on Tuesday

<sup>&</sup>lt;sup>1</sup>i.e.,  $C_0$  or r doesn't occur in  $\mathcal{T}$ 

Extensions

### Extension to $\mathcal{ALCI}$

**Recall:**  $\mathcal{ALCI} = \mathcal{ALC} + \text{ inverse roles:} \exists R^-.C \text{ and } \forall R^-.C$ 

Question: what do we need to change in the

- definition of a Hintikka set?
- definition of a Hintikka tree?
- construction of the automaton?
- elsewhere?

Answer: only

- the matching condition for Hintikka trees
- and its "encoding" in the automaton's transition function

From now on, R denotes a role or its inverse.



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## Adapting Hintikka Trees to $\mathcal{ALCI}$

Remember: they describe relationship between

- the Hintikka set of each node n and
- the Hintikka sets of n's successors



#### Definition:

- A (k+1)-tuple of Hintikka sets  $\mathcal{H}, \mathcal{H}_1, \ldots, \mathcal{H}_k$  is matching if, for every  $i = 1, \ldots, k$  with  $E_i = \exists R. C \in \mathcal{H}$ :
- (M1)  $C \in \mathcal{H}_i$  (for satisfying  $E_i$ , it suffices to consider *i*-th successor)
- (M2) if  $\forall R.D \in \mathcal{H}$ , then  $D \in \mathcal{H}_i$

(M3) if  $\forall \operatorname{Inv}(R) . D \in \mathcal{H}_i$ , then  $D \in \mathcal{H}$   $\operatorname{Inv}(P) = P^-$ ,  $\operatorname{Inv}(P^-) = P$ 

## Adapting the automata construction to $\mathcal{ALCI}$

Remember - basic idea:

 $\bullet\,$  Use Hintikka sets as states and define  $\Delta$  such that

$$s_0 = \ell$$
 in all tuples  $(s_0, \ell, s_1, \dots, s_k) \in \Delta$   
Recall:  $\Delta \subseteq S \times M \times S^k$ 

 $\rightsquigarrow$  If there is an accepting run, it will be identical to the tree

- Use initial states to ensure that  $C_0 \in T(\varepsilon)$
- Check matching via transition relation, e.g., whenever  $(s_0, \ell, s_1, \dots, s_k) \in \Delta$  and  $E_i = \exists R.C \in s_0$ , then:

(M1)  $C \in s_i$ 

(M2) if 
$$\forall R.D \in s_0$$
, then  $D \in s_i$ 

(M3) if 
$$\forall \operatorname{Inv}(R).D \in s_i$$
, then  $D \in s_0$ 

Automata basics	${\cal ALC}$ upper bound	Extensions	Final remarks
And now			

Automata basics

**2** An EXPTIME upper bound for  $\mathcal{ALC}$ 







## What we haven't covered

- $\bullet\,$  More expressive DLs  $\leadsto$  more complex automata models
  - Büchi tree automata for eventualities (trans. closure of roles)
  - and variants thereof
- Alternative approach to EXPTIME-decision procedures: alternating automata
  - States are formulas, not sets of formulas
  - Size of automaton is polynomial in  $|C_0, \mathcal{T}|$
  - Emptiness check is in EXPTIME

 $\rightsquigarrow$  avoid the problem of constructing an exp. large automaton



### Automata versus tableaux: complexity

#### Tableau algorithms

• usually don't yield tight upper bounds (e.g., ExpSpace for  $\mathcal{ALC}$ )

 $\rightsquigarrow$  are usually not worst-case optimal

● but can be optimised in many ways
 → are efficient in many cases

#### Automata-based algorithms

- often yield tight upper bounds (e.g., EXPTIME for  $\mathcal{ALC}$ )  $\rightarrow$  are often worst-case optimal
- rely on the construction of an exponential-size automaton
  - $\rightsquigarrow$  are exponential in the best and average case too
  - $\rightsquigarrow$  leave less room for optimisations

### Automata versus tableaux: summary

#### Tableau algorithms

- $\oplus$  based on a simple idea (model construction)
- $\oplus\,$  amenable to optimisation techniques
- $\oplus\,$  basis for state-of-the-art DL reasoners
- $\ominus$  bad for proving deterministic upper time bounds
- $\ominus\,$  termination proofs can become very hard

#### Automata-based algorithms

- $\oplus \ {\rm elegant} \ {\rm and} \ {\rm simple}$
- $\oplus$  well-suited for proving <code>ExpTIME</code> upper bounds
- $\oplus$  no termination proofs
- $\ominus$  no optimised implementations exist (?)

# That's all for today. Thanks!

