# 1.1 What can we conclude from description logics?

## Which clinical findings can occur on a head?

How: Get subclasses of  $Finding \sqcap \exists FindingSite \cdot Head$ 

## e.g. Heavyhead, resulting from

 $Headache \equiv Pain \sqcap \exists FindingSite \cdot Head$ 

 $Pain \sqsubseteq Finding$ 

 $HeavyHead \sqsubseteq Headache$ 

## Which properties do I have to fill in when recording an allergic head?

How: For each property p check  $AllergicHead \sqsubseteq \exists p \cdot T$ 

#### e.g. FindingSite, resulting from

 $Pain \sqsubseteq \exists FindingSite \cdot T$ 

 $ImmuneFunctionDisorder \sqsubseteq \exists PathologicalProcess \cdot T$ 

 $AllergicHead \sqsubseteq Pain$ 

 $AllergicHead \sqsubseteq ImmuneFunctionDisorder$ 

## Is a Headache occurring in a Leg correct?

How: Check satisfiability of the concept  $Headache \sqcap \exists FindingSite \cdot Leg$ 

## No, because the concept is unsatisfiable, resulting from

 $Headache \sqsubseteq Pain \sqcap \exists FindingSite \cdot Head$ 

 $Pain \subseteq \leq 1FindingSite \cdot T$ 

 $Leg \sqsubseteq \neg Head$ 

#### **Logical Consequence**

For an arbitrary set S of axioms (resp. theory  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$ , where  $S = \mathcal{T} \cup \mathcal{A}$ ):

#### Model

 $\mathcal{I} \models S \text{ if } \mathcal{I} \models \alpha \text{ for all } \alpha \in S \ (\mathcal{I} \text{ is a model of } S, \text{ resp. } \mathcal{K})$ 

#### Logical Consequence

 $S \models \beta$  if  $\mathcal{I} \models \beta$  whenever  $\mathcal{I} \models S$  ( $\beta$  is a logical consequence of S, resp.  $\mathcal{K}$ )

• S is consistent, if S has at least one model

# 1.2 Inference problems

## Inference Problems in TBOX

We have introduced syntax and semantics of the language  $\mathcal{ALC}$ . Now, let's look on automated reasoning. Having a  $\mathcal{ALC}$  theory  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$ . For TBOX  $\mathcal{T}$  and concepts  $C_{(i)}$ , we want to decide whether

(unsatisfiability) concept C is unsatisfiable, i.e.  $\mathcal{T} \models C \sqsubseteq \bot$ ?

(subsumption) concept  $C_1$  subsumes concept  $C_2$ , i.e.  $\mathcal{T} \models C_2 \sqsubseteq C_1$ ?

(equivalence) two concepts  $C_1$  and  $C_2$  are equivalent, i.e.  $\mathcal{T} \models C_1 \equiv C_2$ ?

(disjoint) two concepts  $C_1$  and  $C_2$  are disjoint, i.e.  $\mathcal{T} \models C_1 \sqcap C_2 \sqsubseteq \bot$ ?

All these tasks can be reduced to unsatisfiability checking of a single concept  $\dots$ 

#### Reducting Subsumption to Unsatisfiability

Example

These reductions are straighforward – let's show, how to reduce subsumption checking to unsatisfiability checking. Reduction of other inference problems to unsatisfiability is analogous.

$$(\mathcal{T} \models C_1 \sqsubseteq C_2) \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow \qquad \mathcal{I} \models C_1 \sqsubseteq C_2) \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow \qquad C_1^{\mathcal{I}} \subseteq C_2^{\mathcal{I}}) \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow \qquad C_1^{\mathcal{I}} \cap (\Delta^{\mathcal{I}} \setminus C_2^{\mathcal{I}}) \subseteq \emptyset \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow \qquad \mathcal{I} \models C_1 \sqcap \neg C_2 \sqsubseteq \bot \qquad \text{iff}$$

$$(\mathcal{T} \models C_1 \sqcap \neg C_2 \sqsubseteq \bot)$$

#### Inference Problems for ABOX

... and for ABOX  $\mathcal{A}$ , axiom  $\alpha$ , concept C, role R and individuals  $a_{(i)}$  we want to decide whether

(consistency checking) ABOX  $\mathcal{A}$  is consistent w.r.t.  $\mathcal{T}$  (in short if  $\mathcal{K}$  is consistent).

(instance checking)  $\mathcal{T} \cup \mathcal{A} \models C(a)$ ?

(role checking)  $\mathcal{T} \cup \mathcal{A} \models R(a_1, a_2)$ ?

(instance retrieval) find all individuals a, for which  $\mathcal{T} \cup \mathcal{A} \models C(a)$ .

**realization** find the most specific concept C from a set of concepts, such that  $\mathcal{T} \cup \mathcal{A} \models C(a)$ .

All these tasks, as well as concept unsatisfiability checking, can be reduced to consistency checking. Under which condition and how?

#### Reduction of concept unsatisfiability to theory consistency

Example

Consider an  $\mathcal{ALC}$  theory  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$ , a concept C and a fresh individual  $a_f$  not occurring in  $\mathcal{K}$ :

$$(\mathcal{T} \models C \sqsubseteq \bot) \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow \mathcal{I} \models C \sqsubseteq \bot) \qquad \text{iff}$$

$$(\forall \mathcal{I})(\mathcal{I} \models \mathcal{T} \Longrightarrow C^{\mathcal{I}} \subseteq \emptyset) \qquad \text{iff}$$

$$\neg \left[ (\exists \mathcal{I})(\mathcal{I} \models \mathcal{T} \land C^{\mathcal{I}} \not\subseteq \emptyset) \right] \qquad \text{iff}$$

$$\neg \left[ (\exists \mathcal{I})(\mathcal{I} \models \mathcal{T} \land a_f^{\mathcal{I}} \in C^{\mathcal{I}}) \right] \qquad \text{iff}$$

$$(\mathcal{T}, \{C(a_f)\}) \qquad \text{is inconsistent}$$

Note that for more expressive description logics than  $\mathcal{ALC}$ , the ABOX has to be taken into account as well due to its interaction with TBOX.

# 1.3 Inference Algorithms

Inference Algorithms in Description Logics

**Structural Comparison** is polynomial, but complete just for some simple DLs without full negation, e.g.  $\mathcal{ALN}$ , see [dlh2003].

Finite polynomial rule expansion -  $OWL ext{-}RL$ ,  $OWL ext{-}EL$ 

**Tableaux Algorithms** represent the State of Art for complex DLs – sound, complete, finite

**other** ... – e.g. resolution-based, transformation to finite automata, etc.

We will introduce tableau algorithms.

#### **Tableaux Algorithms**

(TAs are not new in DL – they were known in predicate logics as well.)

Main idea

"ABOX  $\mathcal{A}$  is consistent w.r.t. TBOX  $\mathcal{T}$  if we find a model of  $\mathcal{T} \cup \mathcal{A}$ ." (similarly for theory  $\mathcal{K}$  as a whole)

Each TA can be seen as a production system :

**state** (~ data base) containing a set of *completion graphs* (see next slides),

**inference rules** ( $\sim$  production rules) implement semantics of particular constructs of the given language, e.g.  $\exists, \sqcap$ , etc. and serve to modify the completion graphs accordingly

strategy for picking the most suitable rule for application

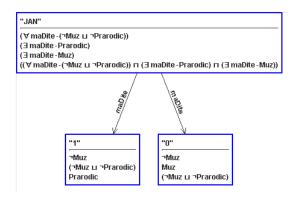
## **Completion Graphs**

(Do not mix with complete graphs from the graph theory.)

## Completion graph

is a labeled oriented graph  $G = (V_G, E_G, L_G)$ , where each

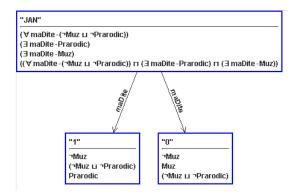
- node  $x \in V_G$  is labeled with a set  $L_G(x)$  of concepts and
- each edge  $\langle x, y \rangle \in E_G$  is labeled with a set of edges  $L_G(\langle x, y \rangle)$  (or shortly  $L_G(x, y)$ )



#### **Completion Graphs**

#### Direct Clash

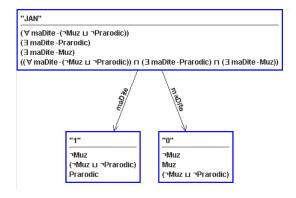
occurs in a completion graph  $G = (V_G, E_G, L_G)$ , if  $\{A, \neg A\} \subseteq L_G(x)$ , or  $\bot \in L_G(x)$  for some atomic concept A and a node  $x \in V_G$ 



#### **Completion Graphs**

#### Complete Completion Graph

is a completion graph  $G = (V_G, E_G, L_G)$ ), to which no inference rule can be applied (any more).



## 1.3.1 Tableau Algorithm for $\mathcal{ALC}$

## Tableau Algorithm for $\mathcal{ALC}$ when $\mathcal{T}=\emptyset$

Let's have  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$ , where  $\mathcal{T} = \emptyset$  for now.

0 (Preprocessing) Transform all concepts appearing in  $\mathcal{K}$  to the "negational normal form" (NNF), "shifting" negation  $\neg$  to the atomic concepts (using equivalent operations known from propositional and predicate logics).

## Example

 $\neg(C_1 \sqcap C_2)$  is equivalent (de Morgan rules) to  $\neg C_1 \sqcup \neg C_2$ .

- 1 Initial state of the algorithm is  $S_0 = \{G_0\}$ , where  $G_0 = (V_{G_0}, E_{G_0}, L_{G_0})$  is made up from  $\mathcal{A}$  as follows:
  - for each  $C(a) \in \mathcal{A}$  put  $a \in V_{G_0}$  and  $C \in L_{G_0}(a)$
  - for each  $R(a_1, a_2) \in \mathcal{A}$  put  $\langle a_1, a_2 \rangle \in E_{G_0}$  and  $R \in L_{G_0}(a_1, a_2)$
  - Sets  $V_{G_0}, E_{G_0}, L_{G_0}$  are smallest possible with these properties.

#### Tableau algorithm for ALC without TBOX (2)

. . .

- 2 Current algorithm state is S. If each  $G \in S$  contains a direct clash, terminate as "INCONSISTENT".
- 3 Let's choose one  $G \in S$  that doesn't contain a direct clash. If G is complete w.r.t. rules shown next, terminate as "CONSISTENT"
- 4 Find a rule that is applicable to G and apply it. As a result, we obtain from the state S a new state S'. Jump to step 2.

## TA for $\mathcal{ALC}$ without TBOX – Inference Rules

```
\rightarrow_{\sqcap} rule
            if (C_1 \sqcap C_2) \in L_G(a) and \{C_1, C_2\} \nsubseteq L_G(a) for some a \in V_G.
       then S' = S \cup \{G'\} \setminus \{G\}, where G' = (V_G, E_G, L_{G'}), and L_{G'}(a) = L_G(a) \cup \{C_1, C_2\} and otherwise is
                the same as L_G.
\rightarrow rule
            if (C_1 \sqcup C_2) \in L_G(a) and \{C_1, C_2\} \cap L_G(a) = \emptyset for some a \in V_G.
       then S' = S \cup \{G_1, G_2\} \setminus \{G\}, where G_{(1|2)} = (V_G, E_G, L_{G_{(1|2)}}), and L_{G_{(1|2)}}(a) = L_G(a) \cup \{C_{(1|2)}\} and
               otherwise is the same as L_G.
\rightarrow_\exists rule
            if (\exists R \cdot C) \in L_G(a_1) and there exists no a_2 \in V_G such that R \in L_G(a_1, a_2) and at the same time
               C \in L_G(a_2).
       then S' = S \cup \{G'\} \setminus \{G\}, where G' = (V_G \cup \{a_2\}, E_G \cup \{\langle a_1, a_2 \rangle\}, L_{G'}), a L_{G'}(a_2) = \{C\}, L_{G'}(a_1, a_2) = \{C\}
                \{R\} and otherwise is the same as L_G.
\rightarrow_\forall rule
            if (\forall R \cdot C) \in L_G(a_1) and there exists a_2 \in V_G such that R \in L_G(a, a_1) and at the same time
       then S' = S \cup \{G'\} \setminus \{G\}, where G' = (V_G, E_G, L_{G'}), and L_{G'}(a_2) = L_G(a_2) \cup \{C\} and otherwise is the
```

## **TA Run Example**

#### Example – Consistency Checking

same as  $L_G$ .

 $\mathcal{K}_2 = (\emptyset, \mathcal{A}_2)$ , where  $\mathcal{A}_2 = \{(\exists maDite \cdot Muz \sqcap \exists maDite \cdot Prarodic \sqcap \neg \exists maDite \cdot (Muz \sqcap Prarodic))(JAN)\}).$ 

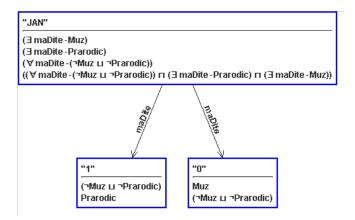
- Let's transform the concept into NNF:  $\exists maDite \cdot Muz \sqcap \exists maDite \cdot Prarodic \sqcap \forall maDite \cdot (\neg Muz \sqcup \neg Prarodic)$
- Initial state  $G_0$  of the TA is

```
"JAN"
((∀ maDite - (¬Muz בי ¬Prarodic)) п (∃ maDite - Prarodic) п (∃ maDite - Muz))
```

#### TA Run Example (2)

Example 1. ...

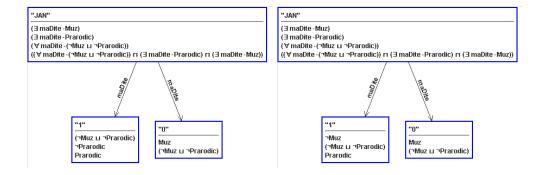
- Now, four sequences of steps 2,3,4 of the TA are performed. TA state in step 4, evolves as follows:
- $\{G_0\} \xrightarrow{\sqcap\text{-rule}} \{G_1\} \xrightarrow{\exists\text{-rule}} \{G_2\} \xrightarrow{\exists\text{-rule}} \{G_3\} \xrightarrow{\forall\text{-rule}} \{G_4\}$ , where  $G_4$  is



## TA Run Example (3)

## Example 2. ...

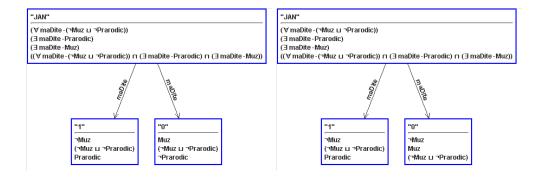
- By now, we applied just deterministic rules (we still have just a single completion graph). At this point no other deterministic rule is applicable.
- Now, we have to apply the  $\sqcup$ -rule to the concept  $\neg Muz \sqcup \neg Rodic$  either in the label of node "0", or in the label of node "1". Its application e.g. to node "1" we obtain the state  $\{G_5, G_6\}$   $(G_5 \text{ left}, G_6 \text{ right})$



## TA Run Example (4)

#### Example 3. ...

• We see that  $G_5$  contains a direct clash in node "1". The only other option is to go through the graph  $G_6$ . By application of  $\sqcup$ -rule we obtain the state  $\{G_5, G_7, G_8\}$ , where  $G_7$  (left),  $G_8$  (right) are derived from  $G_6$ :



•  $G_7$  is complete and without direct clash.

## TA Run Example (5)

Example 4. ... A canonical model  $\mathcal{I}_2$  can be created from  $G_7$ . Is it the only model of  $\mathcal{K}_2$ ?

- $\Delta^{\mathcal{I}_2} = \{Jan, i_1, i_2\},\$
- $maDite^{\mathcal{I}_2} = \{\langle Jan, i_1 \rangle, \langle Jan, i_2 \rangle\},\$
- $Prarodic^{\mathcal{I}_2} = \{i_1\},$
- $Muz^{\mathcal{I}_2} = \{i_2\},$
- " $JAN''^{\mathcal{I}_2} = Jan$ , " $0''^{\mathcal{I}_2} = i_2$ , " $1''^{\mathcal{I}_2} = i_1$ ,

#### **Finiteness**

Finiteness of the TA is an easy consequence of the following:

- $\mathcal{K}$  is finite
- in each step, TA state can be enriched at most by one completion graph (only by application of  $\rightarrow_{\sqcup}$  rule). Number of disjunctions ( $\sqcup$ ) in  $\mathcal{K}$  is finite, i.e. the  $\sqcup$  can be applied just finite number of times.
- for each completion graph  $G = (V_G, E_G, L_G)$  it holds that number of nodes in  $V_G$  is less or equal to the number of individuals in  $\mathcal{A}$  plus number of existential quantifiers in  $\mathcal{A}$ .
- after application of any of the following rules →<sub>□</sub>, →<sub>∃</sub>, →<sub>∀</sub> graph G is either enriched with a new node, new edge, or labeling of an existing node/edge is enriched.
   All these operations are finite.

#### Relation between ABOXes and Completion Graphs

We define also  $\mathcal{I} \models G$  iff  $\mathcal{I} \models \mathcal{A}_G$ , where  $\mathcal{A}_G$  is an ABOX constructed from G, as follows

- C(a) for each node  $a \in V_G$  and each concept  $C \in L_G(a)$  and
- $R(a_1, a_2)$  for each edge  $\langle a_1, a_2 \rangle \in E_G$  and each role  $R \in L_G(a_1, a_2)$

#### Soundness

- Soundness of the TA can be verified as follows. For any  $\mathcal{I} \models \mathcal{A}_{G_i}$ , it must hold that  $\mathcal{I} \models \mathcal{A}_{G_{i+1}}$ . We have to show that application of each rule preserves consistency. As an example, let's take the  $\rightarrow_\exists$  rule:
  - Before application of  $\rightarrow_\exists$  rule,  $(\exists R \cdot C) \in L_{G_i}(a_1)$  held for  $a_1 \in V_{G_i}$ .
  - As a result  $a_1^{\mathcal{I}} \in (\exists R \cdot C)^{\mathcal{I}}$ .
  - Next,  $i \in \Delta^{\mathcal{I}}$  must exist such that  $\langle a_1^{\mathcal{I}}, i \rangle \in R^{\mathcal{I}}$  and at the same time  $i \in C^{\mathcal{I}}$ .
  - By application of  $\rightarrow_{\exists}$  a new node  $a_2$  was created in  $G_{i+1}$  and the label of edge  $\langle a_1, a_2 \rangle$  and node  $a_2$  has been adjusted.
  - It is enough to place  $i=a_2^{\mathcal{I}}$  to see that after rule application the domain element (necessary present in any interpretation because of  $\exists$  construct semantics) has been "materialized". As a result, the rule is correct.
- For other rules, the soundness is shown in a similar way.

#### Completeness

- To prove completeness of the TA, it is necessary to construct a model for each complete completion graph G that doesn't contain a direct clash. Canonical model  $\mathcal{I}$  can be constructed as follows:
  - the domain  $\Delta^{\mathcal{I}}$  will consist of all nodes of G.
  - for each atomic concept A let's define  $A^{\mathcal{I}} = \{a \mid A \in L_G(a)\}$
  - for each atomic role R let's define  $R^{\mathcal{I}} = \{\langle a_1, a_2 \rangle \mid R \in L_G(a_1, a_2) \}$
- Observe that  $\mathcal{I}$  is a model of  $\mathcal{A}_G$ . A backward induction can be used to show that  $\mathcal{I}$  must be also a model of each previous step and thus also  $\mathcal{A}$ .

#### A few remarks on TAs

- Why we need completion graphs? Aren't ABOXes enough to maintain the state for TA?
  - indeed, for  $\mathcal{ALC}$  they would be enough. However, for complex DLs a TA state cannot be stored in an ABOX.
- What about complexity of the algorithm?
  - P-SPACE (between NP and EXP-TIME).

## What if T is not empty?

• consider  $\mathcal{T}$  containing axioms of the form  $C_i \sqsubseteq D_i$  for  $1 \le i \le n$ . Such  $\mathcal{T}$  can be transformed into a single axiom

$$\top \sqsubseteq \top_C$$

```
where \top_C denotes a concept (\neg C_1 \sqcup D_1) \sqcap \ldots \sqcap (\neg C_n \sqcup D_n)
```

• for each model  $\mathcal{I}$  of the theory  $\mathcal{K}$ , each element of  $\Delta^{\mathcal{I}}$  must belong to  $\top_{C}^{\mathcal{I}}$ . How to achieve this ?

## **General Inclusions (2)**

What about this?

```
\rightarrow_{\sqsubseteq} rule
```

if  $\top_C \notin L_G(a)$  for some  $a \in V_G$ .

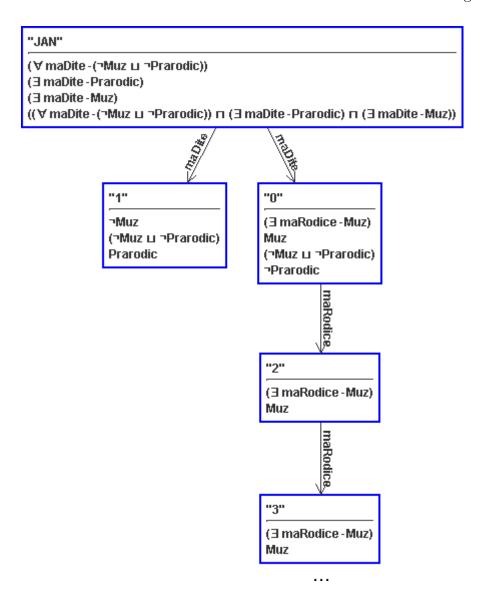
then  $S' = S \cup \{G'\} \setminus \{G\}$ , where  $G' = (V_G, E_G, L_{G'})$ , a  $L_{G'}(a) = L_G(a) \cup \{\top_C\}$  and otherwise is the same as  $L_G$ .

#### Example

Consider  $K_3 = (\{Muz \sqsubseteq \exists maRodice \cdot Muz\}, A_2)$ . Then  $\top_C$  is  $\neg Muz \sqcup \exists maRodice \cdot Muz$ . Let's use the introduced TA enriched by  $\rightarrow_{\sqsubseteq}$  rule. Repeating several times the application of rules  $\rightarrow_{\sqsubseteq}$ ,  $\rightarrow_{\sqcup}$ ,  $\rightarrow_{\exists}$  to  $G_7$  (that is not complete w.r.t. to  $\rightarrow_{\sqsubseteq}$  rule) from the previous example we can get into an infinite loop

## General Inclusions (3)

#### Example



 $\dots$  this algorithm doesn't necessarily terminate  $\odot$ .

## Blocking in TA

- Blocking ensures that inference rules will be applicable until their changes will not repeat "sufficiently frequently".
- For  $\mathcal{ALC}$  it can be shown that so called *subset blocking* is enough:
  - In completion graph G a node x (not present in ABOX A) is blocked by node y, if there is an oriented path from y to x and  $L_G(x) \subseteq L_G(y)$ .
- $\exists$  rule is only applicable if the node  $a_1$  in its definition is not blocked by another node.

# Blocking in TA (2)

- In the previous example, the blocking ensures that node "2" is blocked by node "0" and no other expansion occurs. Which model corresponds to such graph ?
- Introduced TA with subset blocking is sound, complete and finite decision procedure for  $\mathcal{ALC}$ .

# Let's play ...

 $\bullet \ \ http://kbss.felk.cvut.cz/tools/dl$ 

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