### Description Logics and OWL

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Outline



- 2 Towards Description Logics
- $\bigcirc$   $\mathcal{ALC}$  Language
- 4 From ALC to OWL(2)-DL







# Formal Ontologies



• We heard about



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  - RDF,



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  - ontologies as "some shared knowledge structures often visualized through UML-like diagrams" ...
- But how to check they are designed correctly? How to reason about the knowledge inside?
- No single language many graphical/textual languages ranging from informal to formal ones can be used, e.g. *relational algebra*, *Prolog*, *RDFS*, *OWL*, *topic maps*, *thesauri*, *conceptual graphs*



- Logics for Ontologies
  - propositional logic



propositional logic

#### Example

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• ... what is the meaning of these formulas ?



```
Logics for Ontologies (2)
```

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- Proof Theory to enforce the semantics

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### First Order Predicate Logic

#### Example

What is the meaning of this sentence ?

 $(\forall x_1)((Student(x_1) \land (\exists x_2)(GraduateCourse(x_2) \land isEnrolledTo(x_1, x_2)))$  $\Rightarrow (\forall x_3)(isEnrolledTo(x_1, x_3) \Rightarrow GraduateCourse(x_3)))$ 

 $Student \sqcap \exists isEnrolledTo.GraduateCourse \sqsubseteq \forall isEnrolledTo.GraduateCourse$ 



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 $((\forall x)(\exists y)hasFather(x, y) \land Person(y))$ 



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complexity – undecidable (Goedel)

### **Open World Assumption**

#### OWA

FOPL accepts Open World Assumption, i.e. whatever is not known is not necessarily false.

As a result, FOPL is monotonic, i.e.

#### monotonicity

No conclusion can be invalidated by adding extra knowledge.

This is in contrary to relational databases, or Prolog that accept Closed World Assumption.











# **Towards Description Logics**



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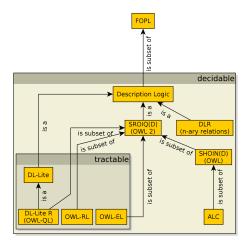
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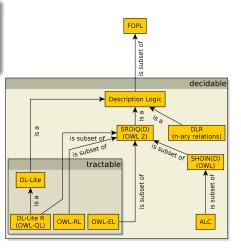
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  - Prolog is not an implementation of FOPL OWA vs. CWA, negation as failure, problems in expressing disjunctive knowledge, etc.







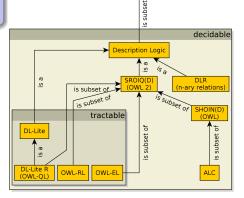
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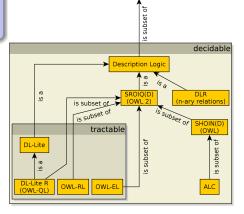


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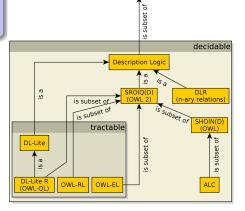


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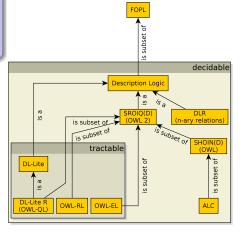


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# ${\cal ALC}$ Language



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• Theory  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$  (in OWL refered as Ontology) consists of a



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ABOX A - representing a particular relational structure (data), e.g.  $A = \{Man(JOHN), loves(JOHN, MARY)\}$ 



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DLs differ in their expressive power (concept/role constructors, axiom types).



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$$\begin{array}{c} A^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}} \\ \mathsf{R}^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}} \times \Delta^{\mathcal{I}} \\ a^{\mathcal{I}} \in \Delta^{\mathcal{I}} \end{array}$$



# ALC (= attributive language with complements)

Having concepts C, D, atomic concept A and atomic role R, then for interpretation  ${\mathcal I}$  :

concept	$concept^{\mathcal{I}}$	description
Т	$\Delta^{\mathcal{I}}$	(universal concept)
$\perp$	Ø	(unsatisfiable concept)
$\neg C$	$\Delta^\mathcal{I} \setminus C^\mathcal{I}$	(negation)
$C_1 \sqcap C_2$	$\mathcal{C}_1^\mathcal{I}\cap\mathcal{C}_2^\mathcal{I}$	(intersection)
$C_1 \sqcup C_2$	$C_1^\mathcal{I} \cup C_2^\mathcal{I}$	(union)
$\forall R \cdot C$	$\{a \mid \forall b((a, b) \in R^{\mathcal{I}} \implies b \in C^{\mathcal{I}})\}$	(universal restriction)
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	axiom	$\mathcal{I} \models axiom \text{ iff } description}$	
TBOX	$C_1 \sqsubseteq C_2$	$C_1^{\mathcal{I}} \subseteq C_2^{\mathcal{I}}$ (inclusion)	
	$C_1 \equiv C_2$	$C_1^{\overline{I}} = C_2^{\overline{I}}$ (equivalence)	



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ABOX (UNA = unique name assumption <sup>1</sup> )					
	axiom	$\mathcal{I} \models axiom iff$	description	_	
	C(a)	$a^{\mathcal{I}} \in \mathcal{C}^{\mathcal{I}}$	(concept assertion)	_	
	$R(a_1,a_2)$	$(\textit{a}_{1}^{\mathcal{I}},\textit{a}_{2}^{\mathcal{I}}) \in \textit{R}^{\mathcal{I}}$	(role assertion)		

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#### Example

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- How to define concept GrandParent ? (specify an axiom)
  - *GrandParent*  $\equiv$  *Person*  $\sqcap \exists hasChild \cdot \exists hasChild \cdot \top$
- How does the previous axiom look like in FOPL ?

 $\forall x (GrandParent(x) \equiv (Person(x) \land \exists y (hasChild(x, y) \land \exists z (hasChild(y, z)))))$ 

$$\mathcal{ALC} \text{ Example} - \mathcal{T}$$

### Example

Woman	≡	Person □ Female
Man	≡	<i>Person</i> ⊓ ¬ <i>Woman</i>
Mother	≡	<i>Woman</i> ⊓ ∃ <i>hasChild</i> · <i>Person</i>
Father	≡	<i>Man</i> ⊓ ∃ <i>hasChild</i> · <i>Person</i>
Parent	≡	Father ⊔ Mother
Grandmother	≡	<i>Mother</i> ⊓∃ <i>hasChild</i> · <i>Parent</i>
otherWithoutDaughter	≡	<i>Mother</i> $\sqcap \forall hasChild \cdot \neg Woman$
Wife	≡	<i>Woman</i> □ ∃hasHusband · Man



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# Interpretation – Example

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  - GrandParent $\mathcal{I}_1 = { John }$
  - $JOHN^{\mathcal{I}_1} = \{John\}$
- this model is finite and has the form of a tree with the root in the node John :





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Both properties represent important characteristics of  $\mathcal{ALC}$  that significantly speed-up reasoning.



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#### Finite model property (FMP)

Every consistent  $\mathcal{K} = (\mathcal{T}, \mathcal{A})$  has a *finite model*.

Both properties represent important characteristics of  $\mathcal{ALC}$  that significantly speed-up reasoning.

In particular (generalized) TMP is a characteristics that is shared by most DLs and significantly reduces their computational complexity.

#### Example

ABOX

hasChild(JOCASTA, OEDIPUS) hasChild(OEDIPUS, POLYNEIKES) Patricide(OEDIPUS) hasChild(JOCASTA, POLYNEIKES) hasChild(POLYNEIKES, THERSANDROS) ¬Patricide(THERSANDROS)

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Edges represent role assertions of *hasChild*; red/green colors distinguish concepts instances – *Patricide* a  $\neg$ *Patricide* 

$$JOCASTA \longrightarrow POLYNEIKES \longrightarrow THERSANDROS$$

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 $JOCASTA \longrightarrow \bullet \longrightarrow \bullet$ 

Q2 Find individuals x such that  $\mathcal{K} \models C(x)$ , where C is

 $\neg$ *Patricide*  $\sqcap \exists$ *hasChild*<sup> $- \cdot$ </sup> (*Patricide*  $\sqcap \exists$ *hasChild*<sup> $- \cdot$ </sup> {*JOCASTA*})

What is the difference, when considering CWA ?

 $JOCASTA \longrightarrow \bullet \longrightarrow x$ 

Petr Křemen (petr.kremen@fel.cvut.cz)

Description Logics and OWL

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



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



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









# From ALC to OWL(2)-DL



Extending  $\dots \mathcal{ALC} \dots$ 

• We have introduced *ALC*. Its expressiveness is higher than the expressiveness of the propositional calculus, still it lacks many constructs needed for practical applications.



Extending  $\dots \mathcal{ALC} \dots$ 

- We have introduced *ALC*. Its expressiveness is higher than the expressiveness of the propositional calculus, still it lacks many constructs needed for practical applications.
- Let's take a look, how to extend ALC while preserving decidability.



# Extending $\dots ALC \dots (2)$

 ${\cal N}$  (Number restructions) are used for restricting the number of successors in the given role for the given concept.

syntax (concept)	semantics	
$(\geq n R)$	$\left\{ \left. a \right   \left  \left\{ b \mid (a,b) \in R^{\mathcal{I}} \right\} \right  \ge n \right.$	$\left. \right\}$
$(\leq n R)$	$\left\{ \left. a \right   \left  \{ b \mid (a, b) \in R^{\mathcal{I}} \} \right  \leq n \right.$	}
(= n R)	$\left\{ a \middle   \left  \{ b \mid (a, b) \in R^{\mathcal{I}} \} \right  = n \right.$	<pre>}</pre>

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• ... and 
$$Bicycle \equiv (= 2 hasWheel)$$
?

# Extending $\dots ALC \dots (3)$

- $\mathcal{Q}$  (Qualified number restrictions) are used for restricting the number of successors of the given type in the given role for the given concept.
  - syntax (concept) semantics

$$(\geq n R C) \qquad \begin{cases} a \\ | \{b | (a, b) \in R^{\mathcal{I}} \land b^{\mathcal{I}} \in C^{\mathcal{I}}\}| \geq n \\ (\leq n R C) \\ (= n R C) \end{cases} \qquad \begin{cases} a \\ | \{b | (a, b) \in R^{\mathcal{I}} \land b^{\mathcal{I}} \in C^{\mathcal{I}}\}| \leq n \\ a \\ | \{b | (a, b) \in R^{\mathcal{I}} \land b^{\mathcal{I}} \in C^{\mathcal{I}}\}| = n \end{cases} \end{cases}$$

#### Example

Concept Woman □ (≥ 3 hasChild Man) denotes women who have at least 3 sons.

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- $\bullet$  Which qualified number restrictions can be expressed in  $\mathcal{ALC}$  ?

Extending  $\dots \mathcal{ALC} \dots (4)$ 

#### Example

• Concept {*MALE*, *FEMALE*} denotes a gender concept that must be interpreted with at most two elements. Why at most ?



Extending  $\dots \mathcal{ALC} \dots (4)$ 

O (Nominals) can be used for naming a concept elements explicitly. syntax (concept) semantics

 $\{a_1,\ldots,a_n\} \qquad \{a_1^{\mathcal{I}},\ldots,a_n^{\mathcal{I}}\}$ 

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- Continent ≡ {EUROPE, ASIA, AMERICA, AUSTRALIA, AFRICA, ANTARCTICA} ?



Extending  $\dots \mathcal{ALC} \dots (5)$ 

 ${\mathcal I}$  (Inverse roles) are used for defining role inversion.

 $\frac{\text{syntax (role)}}{R^{-}} \qquad \frac{\text{semantics}}{(R^{\mathcal{I}})^{-1}}$ 

#### Example

• Role *hasChild*<sup>-</sup> denotes the relationship *hasParent*.



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- What denotes axiom *Person*  $\sqsubseteq \exists hasChild^- \cdot \exists hasChild \cdot \top$ ?



Extending  $\dots \mathcal{ALC} \dots (6)$ 

 trans (Role transitivity axiom) denotes that a role is transitive. Attention – it is not a transitive closure operator.

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#### Example

• Role *isPartOf* can be defined as transitive, while role *hasParent* is not. What about roles *hasPart*, *hasPart<sup>-</sup>*, *hasGrandFather<sup>-</sup>*?



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- What is a transitive closure of a relationship ? What is the difference between a transitive closure of *hasDirectBoss*<sup>I</sup> and *hasBoss*<sup>I</sup>.



Extending  $\ldots ALC \ldots (7)$ 

 ${\cal H}$  (Role hierarchy) serves for expressing role hierarchies (taxonomies) – similarly to concept hierarchies.

syntax (axiom)semantics $R \sqsubseteq S$  $R^{\mathcal{I}} \subseteq S^{\mathcal{I}}$ 

#### Example

• Role hasMother can be defined as a special case of the role hasParent.



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- Role hasMother can be defined as a special case of the role hasParent.
- What is the difference between a concept hierarchy *Mother* ⊑ *Parent* and role hierarchy *hasMother* ⊑ *hasParent*.



# Extending $\dots \mathcal{ALC} \dots (8)$

 ${\cal R}$  (role extensions) serve for defining expressive role constructs, like role chains, role disjunctions, etc.

syntax	semantics
$R \circ S \sqsubseteq P$	$R^{\mathcal{I}} \circ S^{\mathcal{I}} \sqsubseteq P^{\mathcal{I}}$
Dis(R, S)	$R^{\mathcal{I}} \cap S^{\mathcal{I}} = \emptyset$
$\exists R \cdot Self$	$\{\textit{a} (\textit{a},\textit{a}) \in \textit{R}^{\mathcal{I}}\}$

#### Example

• How would you define the role *hasUncle* by means of *hasSibling* and *hasParent* ?



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#### Example

- How would you define the role *hasUncle* by means of *hasSibling* and *hasParent* ?
- how to express that R is transitive, using a role chain ?
- Whom does the following concept denote  $Person \sqcap \exists likes \cdot Self$  ?



## **Global restrictions**

• *Simple roles* have no (direct or indirect) subroles that are either *transitive* or are defined by means of property chains

hasFather $\circ$ hasBrother		hasUncle
hasUncle		hasRelative
hasBiologicalFather		hasFather

hasRelative and hasUncle are not simple.

- Each concept construct and each axiom from this list contains only *simple roles*:
  - number restrictions  $(\ge n R)$ , (= n R),  $(\le n R)$  + their qualified versions
  - $\exists R \cdot Self$
  - functionality/inverse functionality (leads to number restrictions)
  - irreflexivity, asymmetry, and disjoint object properties.

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    - syntactic sugar axioms NegativeObjectPropertyAssertion, AllDisjoint, etc.
    - extralogical constructs imports, annotations
      - data types XSD datatypes are used



• How to express e.g. that "A cousin is someone whose parent is a sibling of your parent." ?



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- ... we need rules, like

 $hasCousin(?c_1,?c_2) \leftarrow hasParent(?c_1,?p_1), hasParent(?c_2,?p_2),$  $Man(?c_2), hasSibling(?p_1,?p_2)$ 



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• in general, each variable can bind **domain elements** (i.e. elements of the interpretation domain, not only named individual); however, such version is *undecidable*.



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#### DL-safe rules

DL-safe rules are decidable conjunctive rules where each variable **only binds individuals** (not domain elements themselves).

Modal Logic introduces modal operators – possibility/necessity, used in multiagent systems.

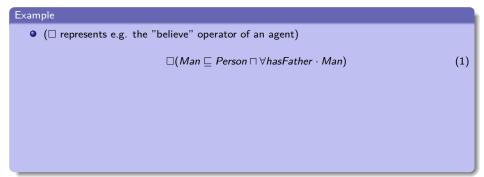


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Example

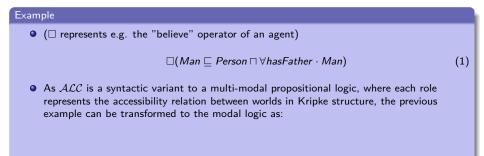


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Vague Knowledge - fuzzy, probabilistic and possibilistic extensions



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Data Types (D) allow integrating a data domain (numbers, strings), e.g.  $Person \sqcap \exists hasAge \cdot 23$  represents the concept describing "23-years old persons".



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