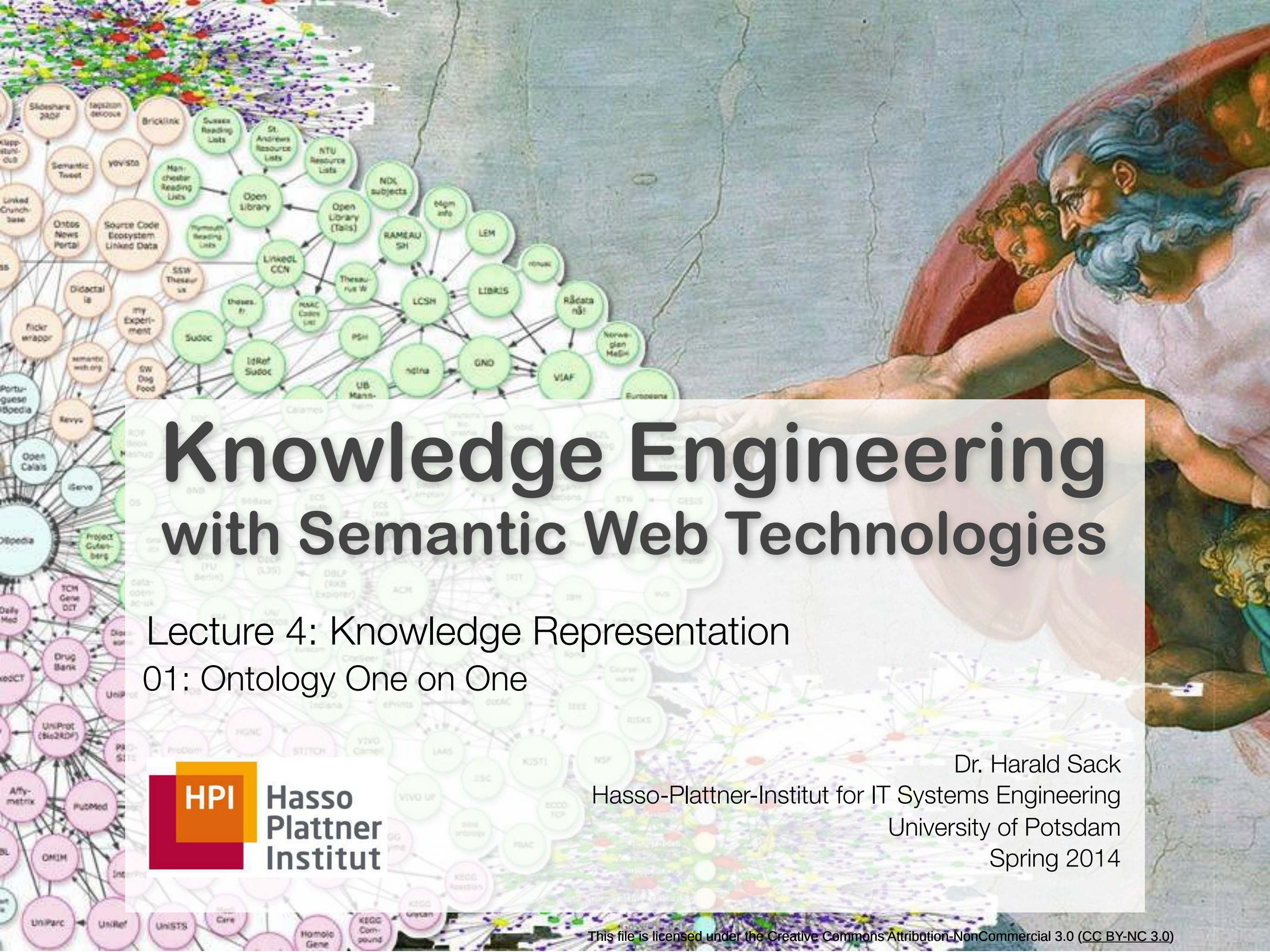


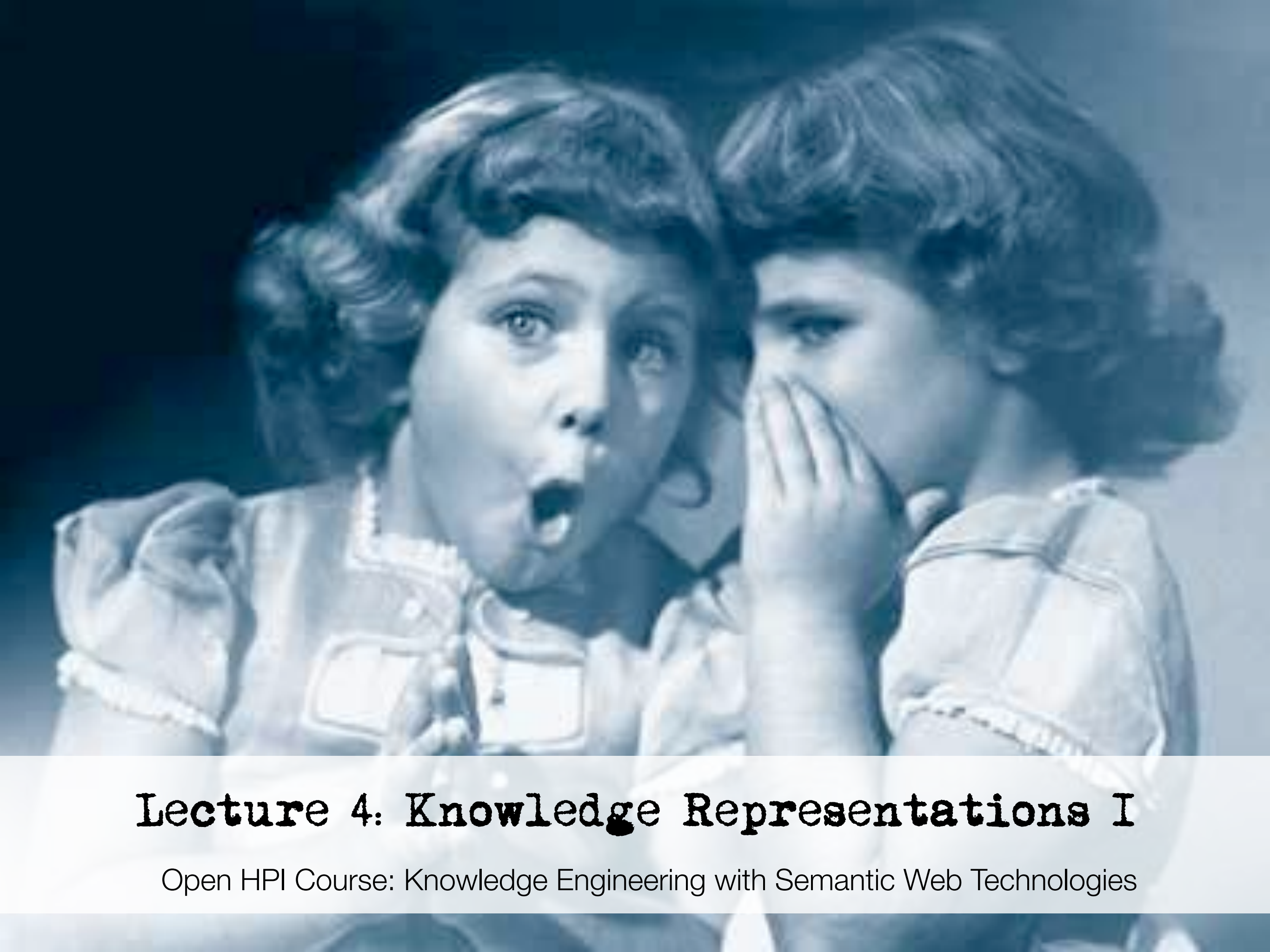


Knowledge Engineering with Semantic Web Technologies

Lecture 4: Knowledge Representation 01: Ontology One on One

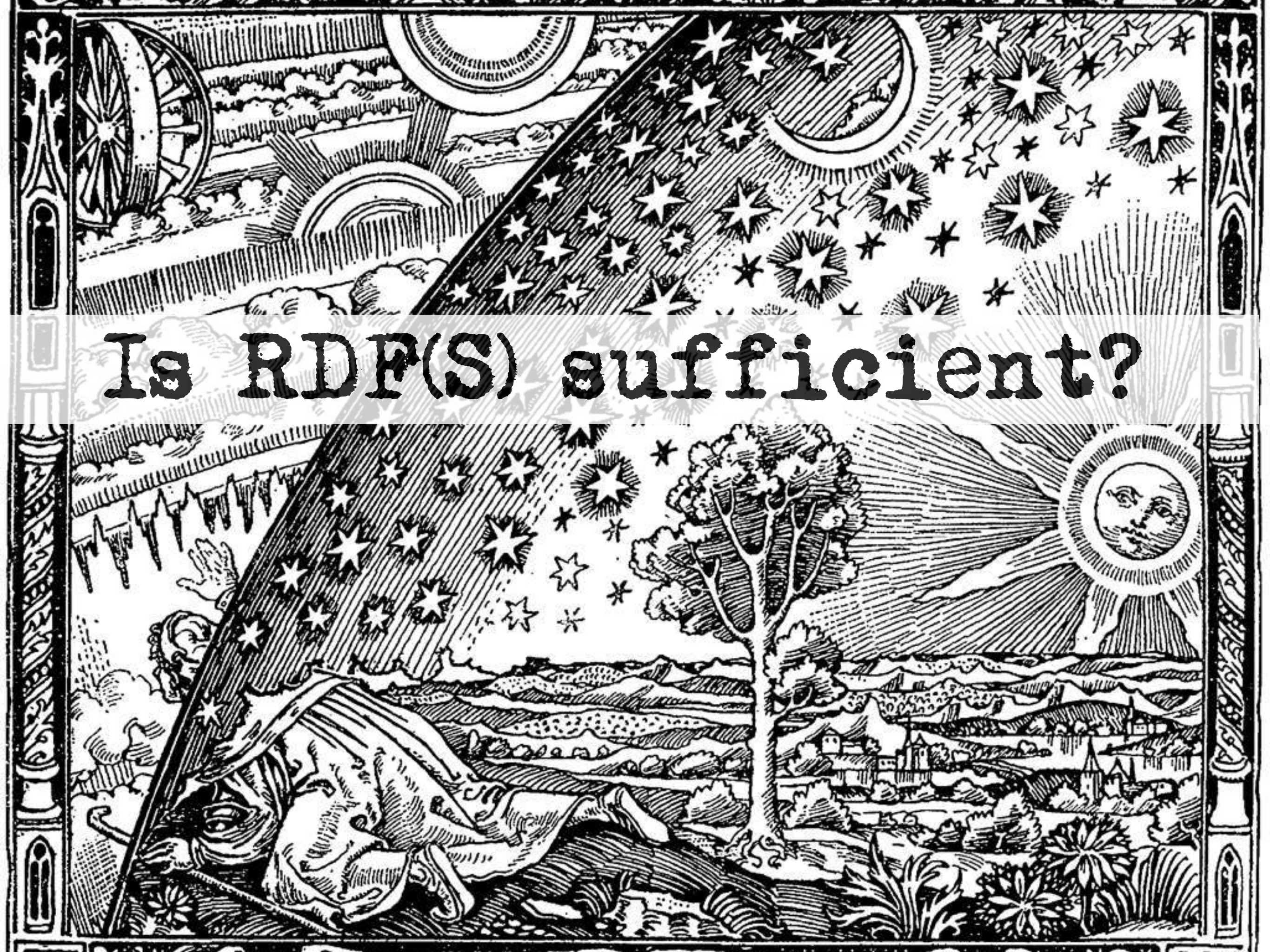


Dr. Harald Sack
Hasso-Plattner-Institut for IT Systems Engineering
University of Potsdam
Spring 2014



Lecture 4: Knowledge Representations I

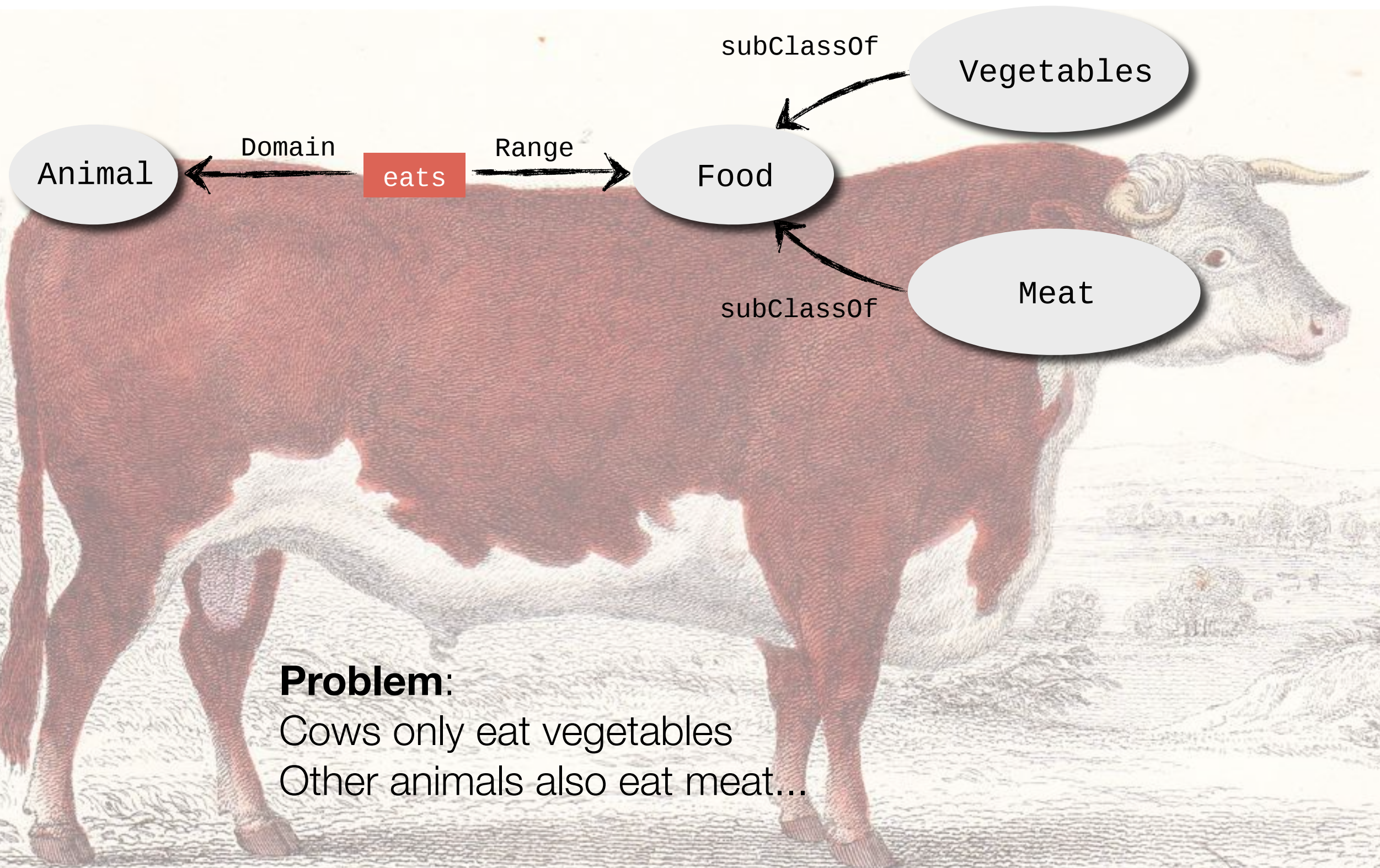
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Is RDF(S) sufficient?

Just one example...

4

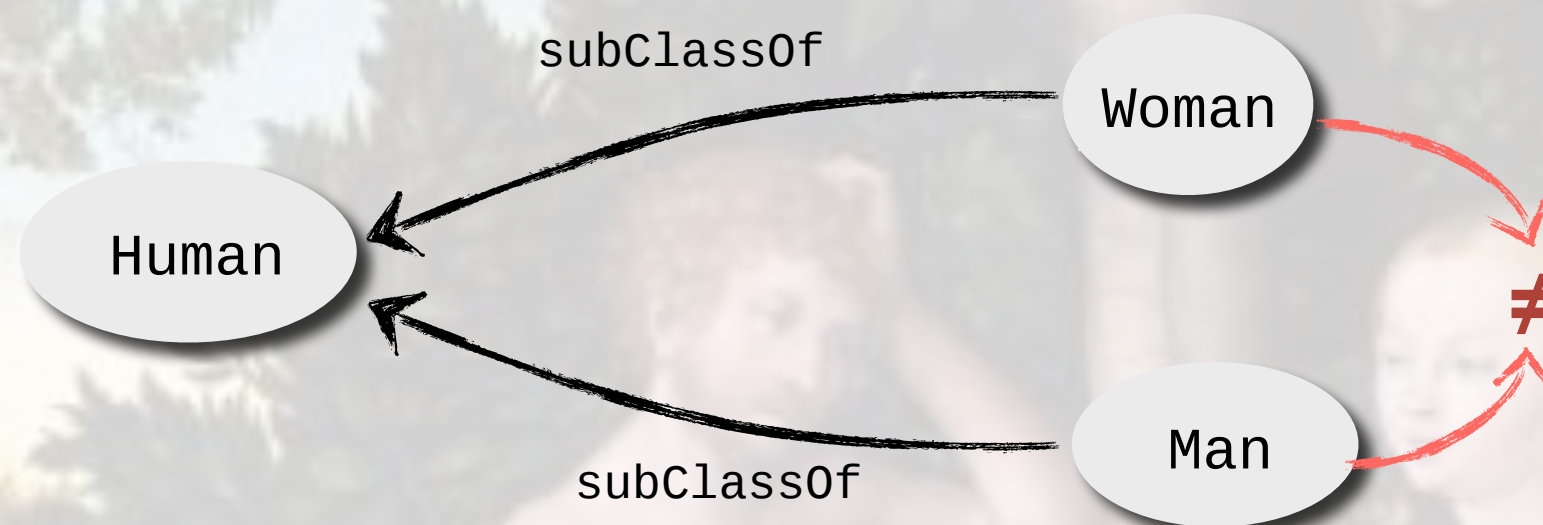


Problem:

Cows only eat vegetables

Other animals also eat meat...

Just another example...



Problem:

Subclass relation cannot express disjunctive class (subclass) membership

4. Knowledge Representations

Ontology One on One

The Semantic Web Technology Stack (not a piece of cake...)

Most apps use only a subset of the stack

Querying allows fine-grained data access

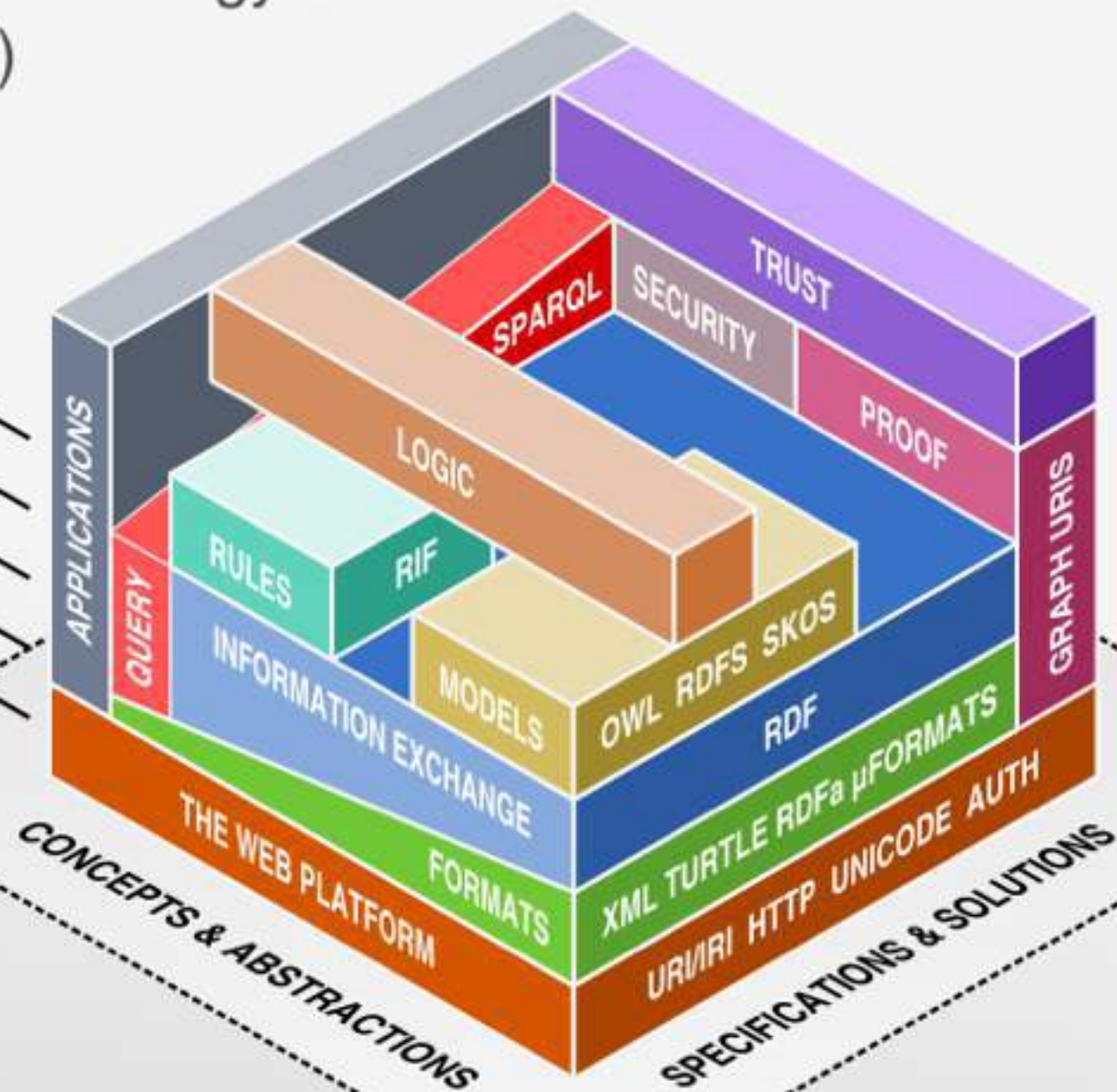
Standardized information exchange is key

Formats are necessary, but not too important

The Semantic Web is based on the Web

Linked Data uses a small
selection of technologies

LINKED DATA





01 Ontology One on One

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Lecture 04: Knowledge Representations Pt.2



„People can't share knowledge if
they don't speak a common language“

Thomas Davenport (1997)



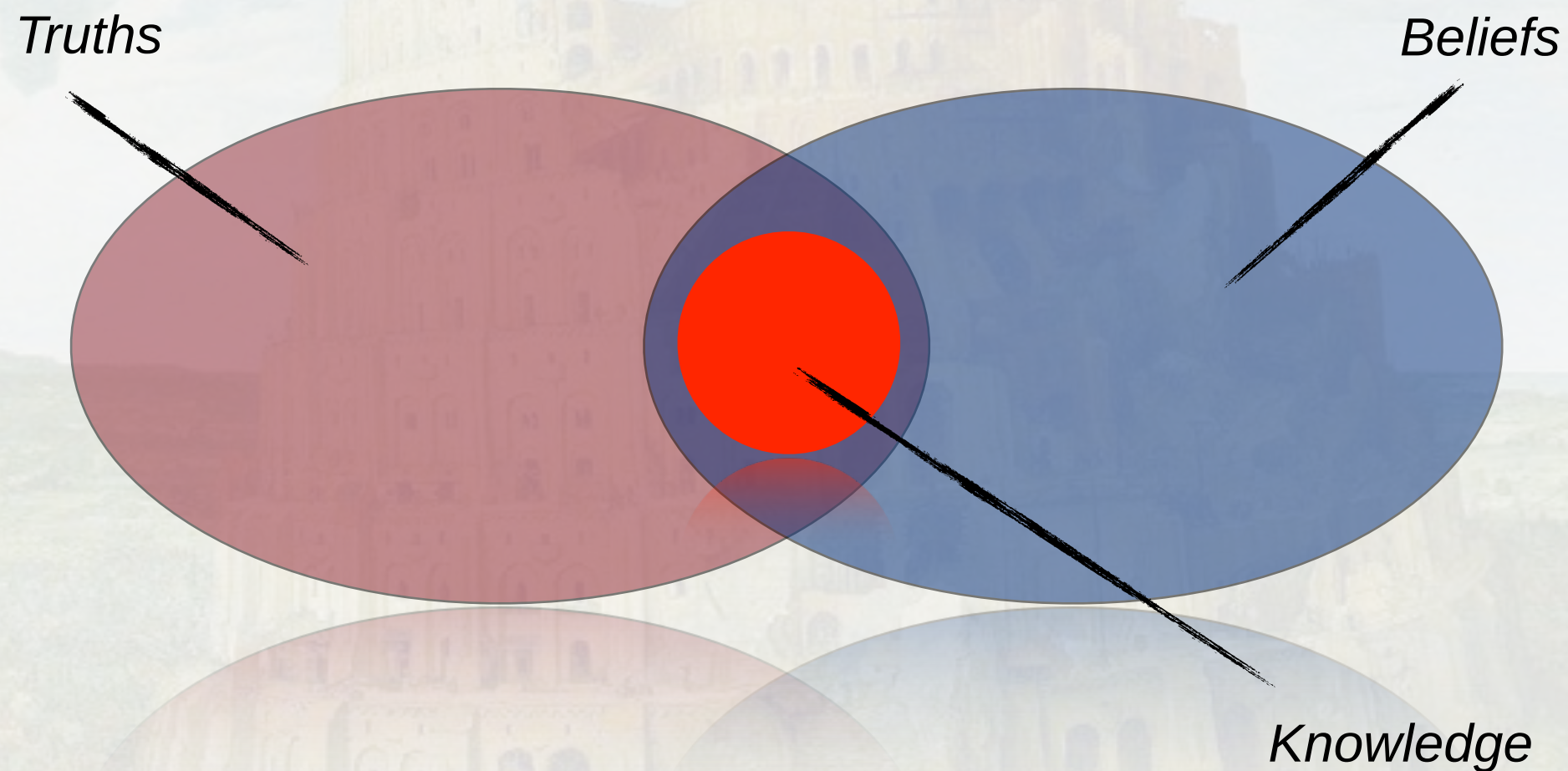
Turmbau zu Babel, Pieter Bruegel, 1563

To speak a common language...

- common symbols and concepts (**Syntax**)
- agreement about their meaning (**Semantics**)
- classification of concepts (**Taxonomy**)
- associations and relations of concepts (**Thesauri**)
- rules and knowledge about which relations are allowed and make sense (**Ontologies**)

What is Knowledge?

10



Traditional Definition: „Knowledge is a subset of all true beliefs“



To represent knowledge, we need a
formal knowledge representation:

⇒ Ontologies





Ontology is the philosophical study of the nature of being, existence, or reality, as well as the basic categories of being and their relations...



1. What does it mean for a being to be?

- When are two things identical?
- Is everything that exists also real?
- Does something exist, if it is only possible?
- Are there non-existing things?

2. What categories of objects do exist?

- Do things exist that are only unique or only multiple (*Universalia*)?
- Do things exist that are unilaterally dependent of others (*Substances*)?
- Of which sort is this dependency (*Causality*)?
- Do necessary properties exist (*Essences*)?
- How do composed things relate to their components?

The Concept of Ontology in Computer Science

"An ontology is an **explicit, formal specification of a shared conceptualization**. The term is borrowed from philosophy, where an Ontology is a systematic account of Existence. For AI systems, what 'exists' is that which can be represented."

Thomas R. Gruber: A Translation Approach to Portable Ontology Specifications. Knowledge Acquisition, 5(2):199-220, 1993.

conceptualization:

abstract model
(domain, identified relevant
concepts, relations)

explicit:

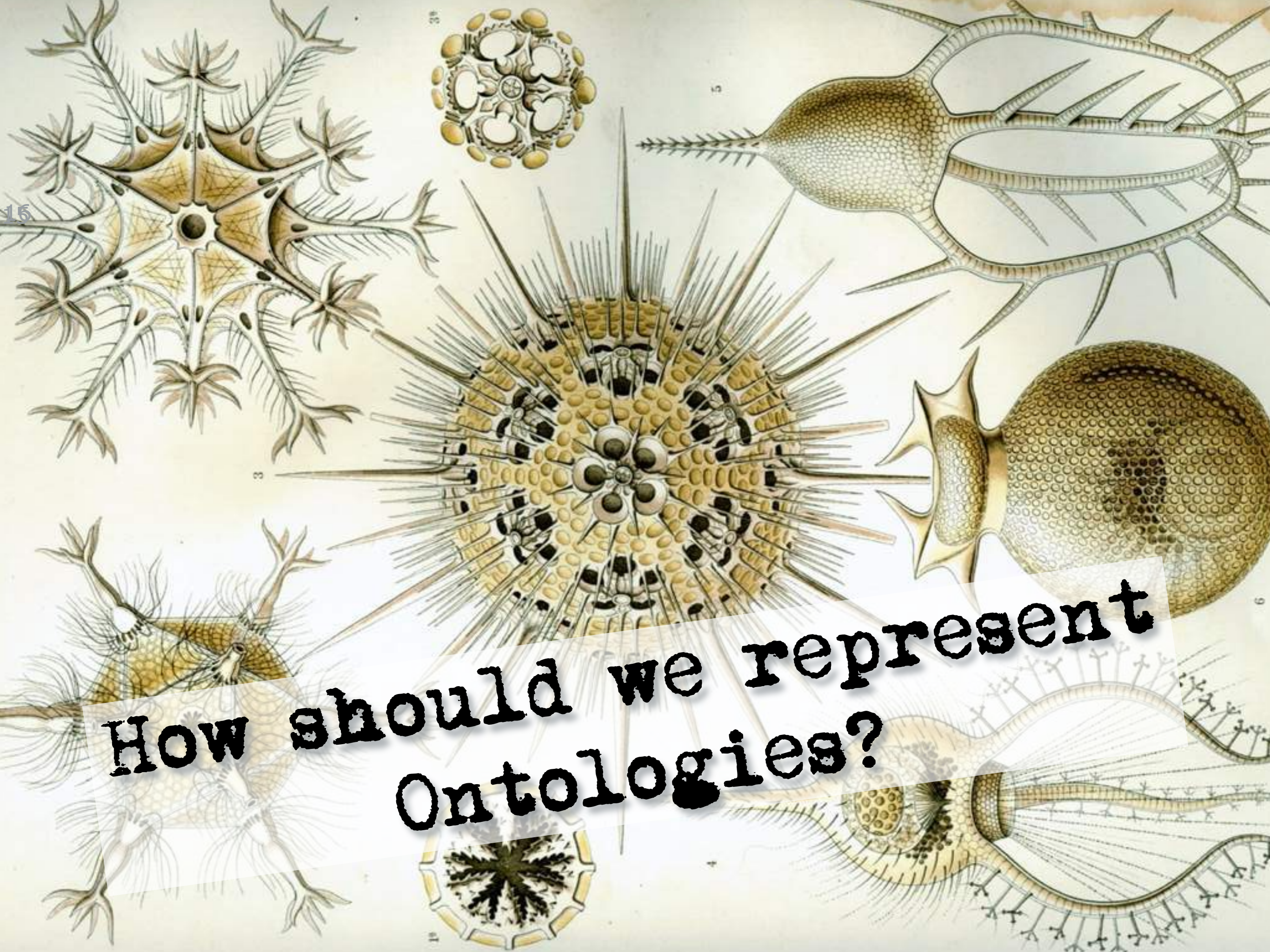
meaning of all concepts must be defined

formal:

machine understandable

shared:

consensus about ontology



How should we represent
Ontologies?

- Classes, Relations and Instances
- **Classes** represent concepts
- Classes are described via attributes
- Attributes are Name Value pairs

„The address contains the name, title, and place of residence of the person addressed“

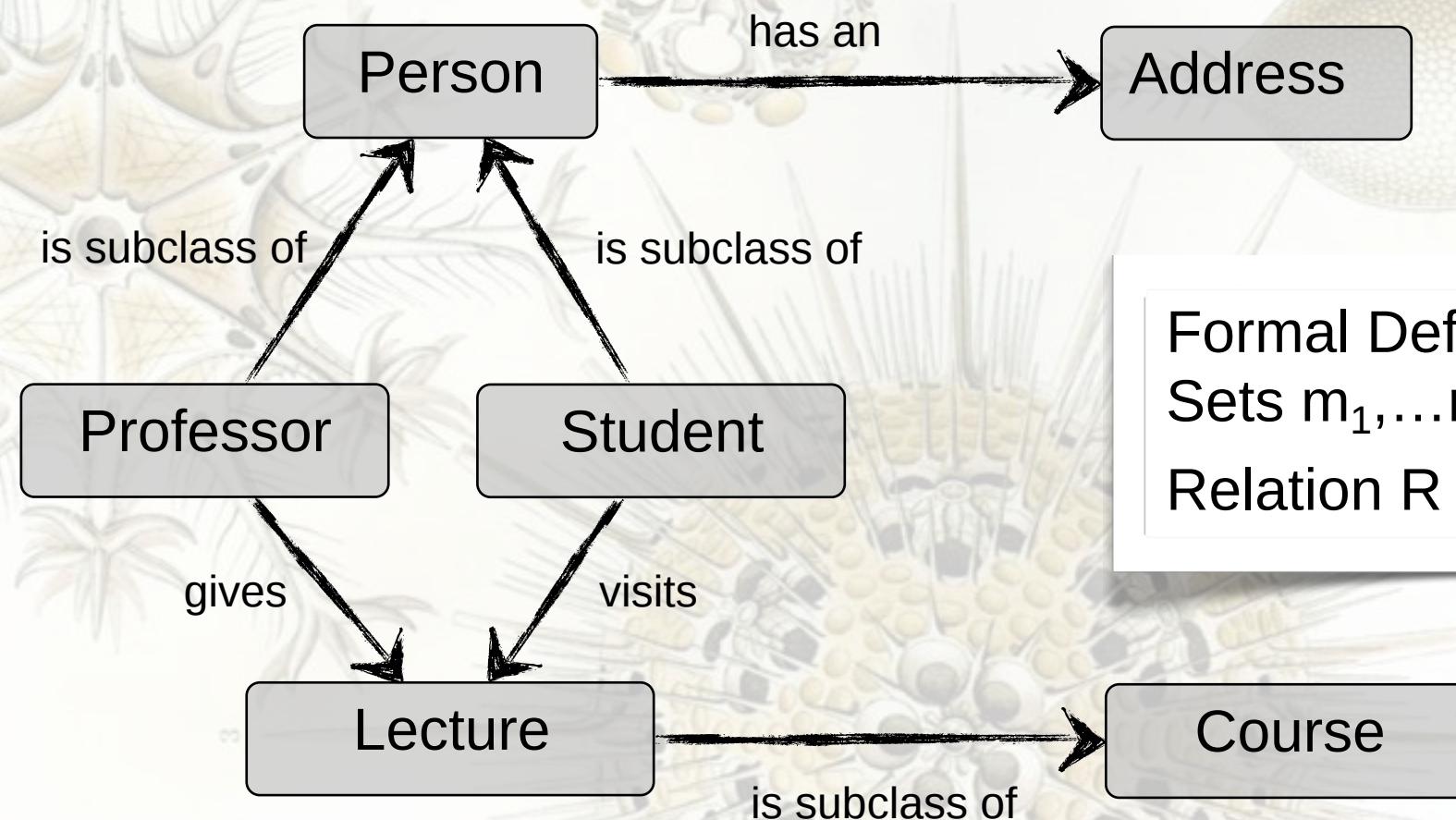
Informal Description

Address

- given name *<string>*
- family name *<string>*
- street *<string>*
- ZIP code *<int>*
- city *<string>*
- ...

Semi informal Description

- **Classes** are related to other classes



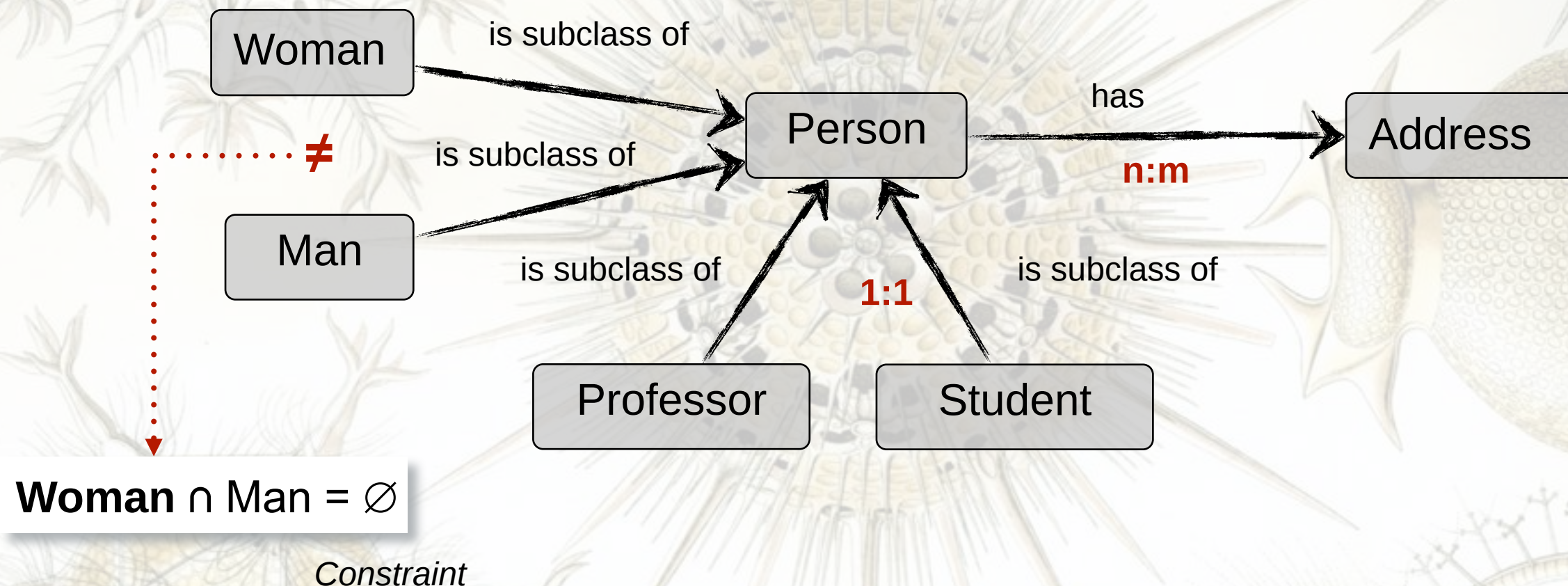
Formal Definition:

Sets $m_1, \dots, m_n$

Relation $R \subseteq m_1 \times \dots \times m_n$

- **Relations** are special attributes, whose values are objects of (other) classes

- For Relations and Attributs **Constraints** (Rules) can be defined that determine allowed values



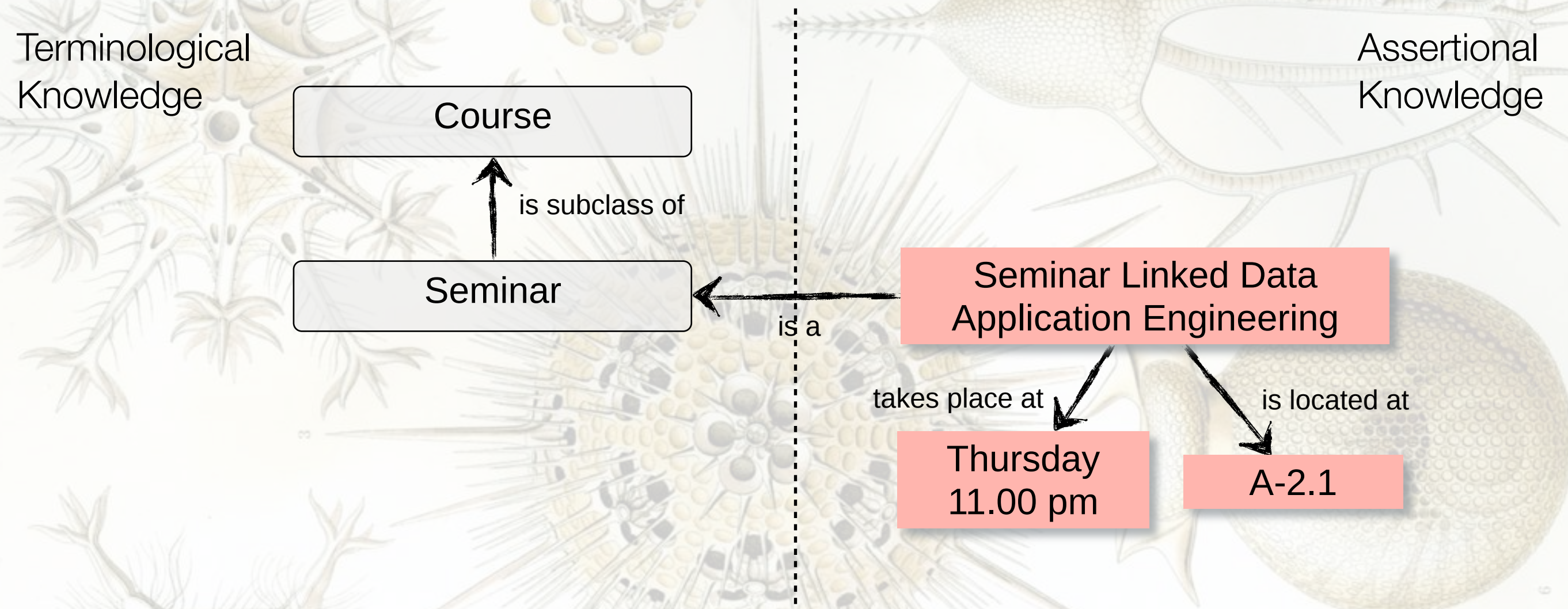
- Classes, relations, and constraints can be put together to form **statements / assertions**
- Special Case: **formal Axioms**

Example:

It is not possible to lecture two courses at the same time.

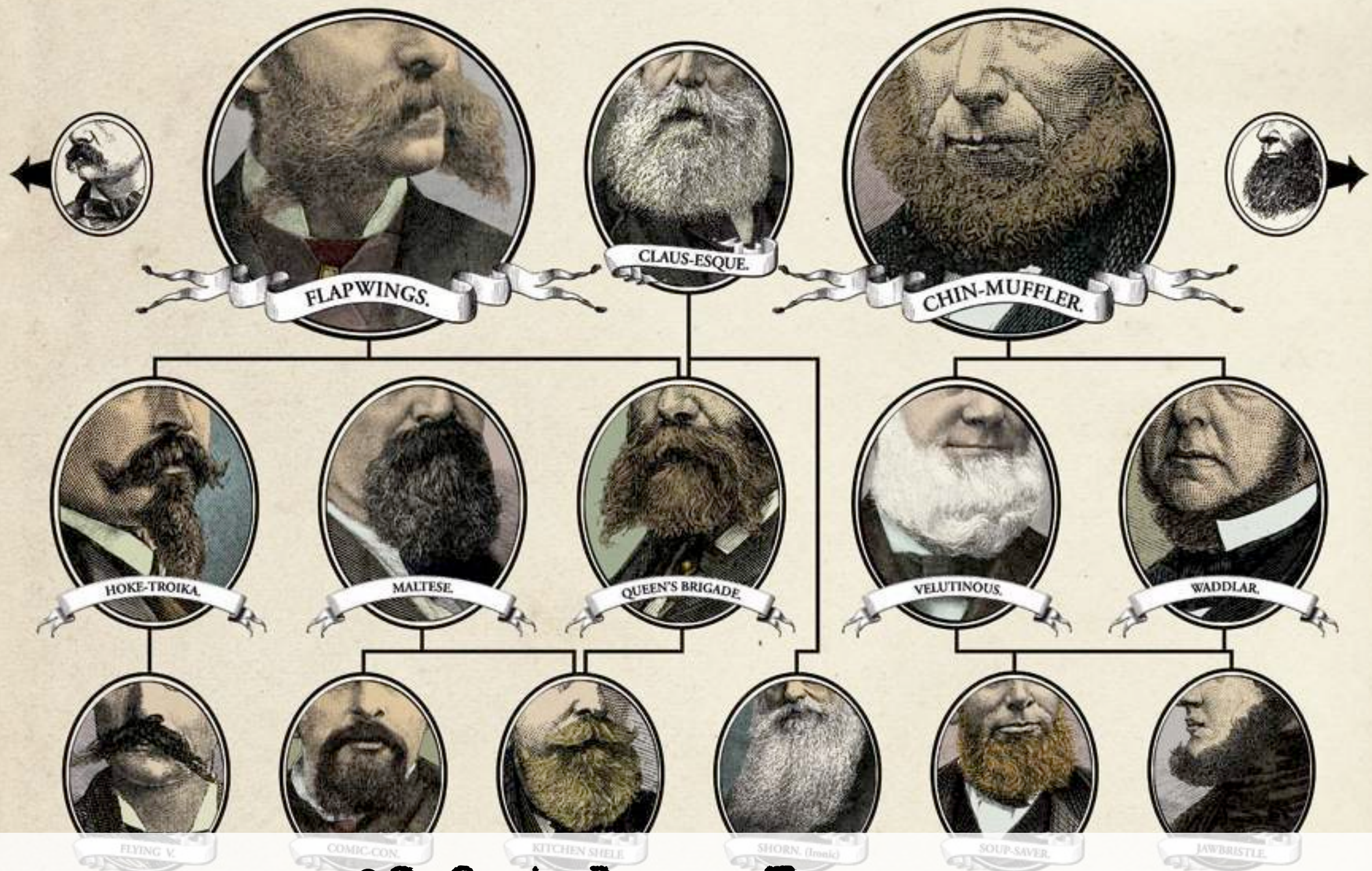
- **Axioms** describe knowledge that can't be expressed simply with the help of other existing components.

- **Instances** describe individuals of an ontology



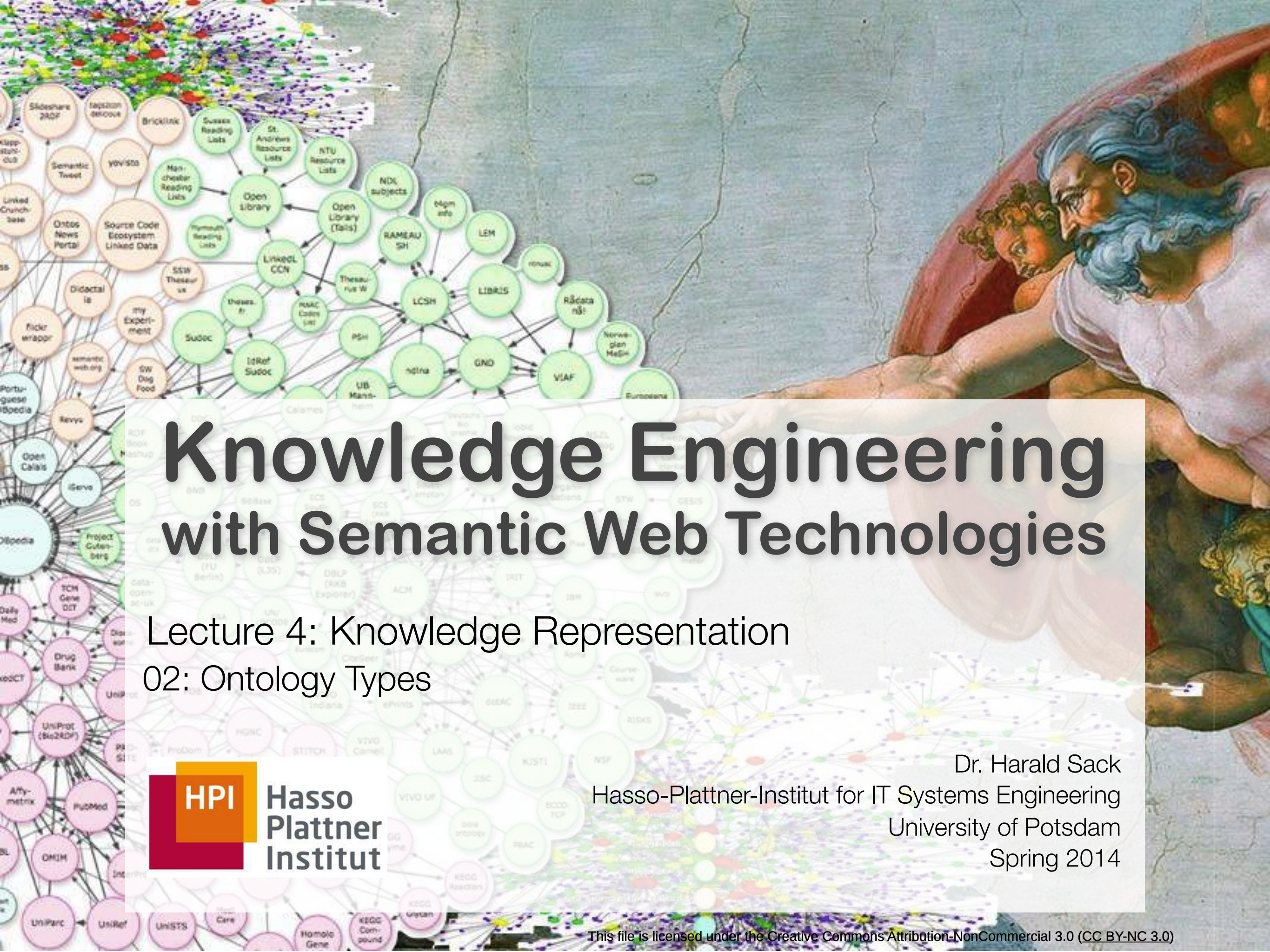
Individuals (instances) are the basic components of an ontology. The individuals in an ontology may include concrete objects such as people, animals, tables, automobiles, molecules, and planets, as well as abstract individuals such as numbers and words.

HIERARCHY OF BEARDS.



02 Ontology Types

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Lecture 04: Knowledge Representations Pt.2

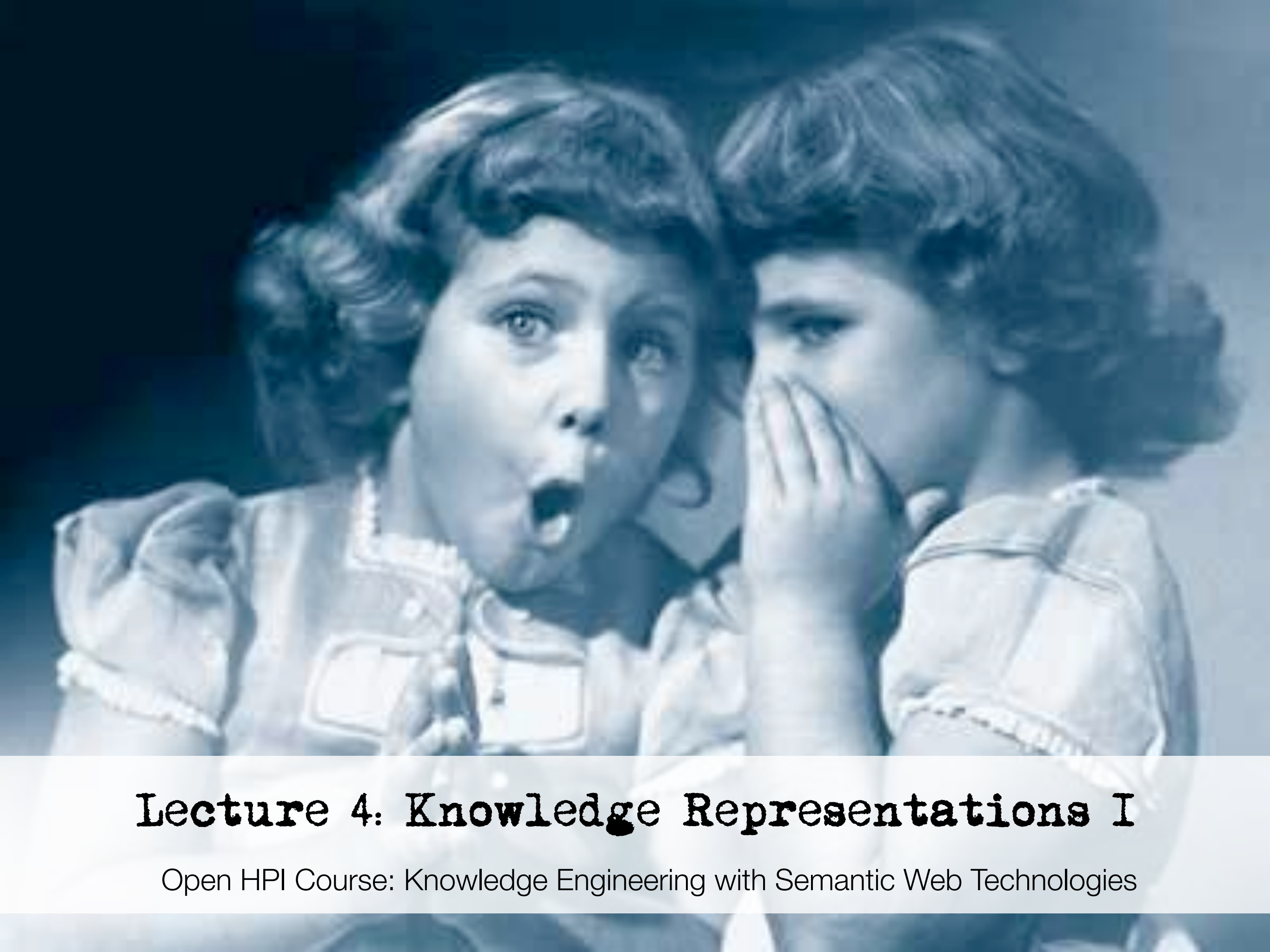


Knowledge Engineering with Semantic Web Technologies

Lecture 4: Knowledge Representation 02: Ontology Types



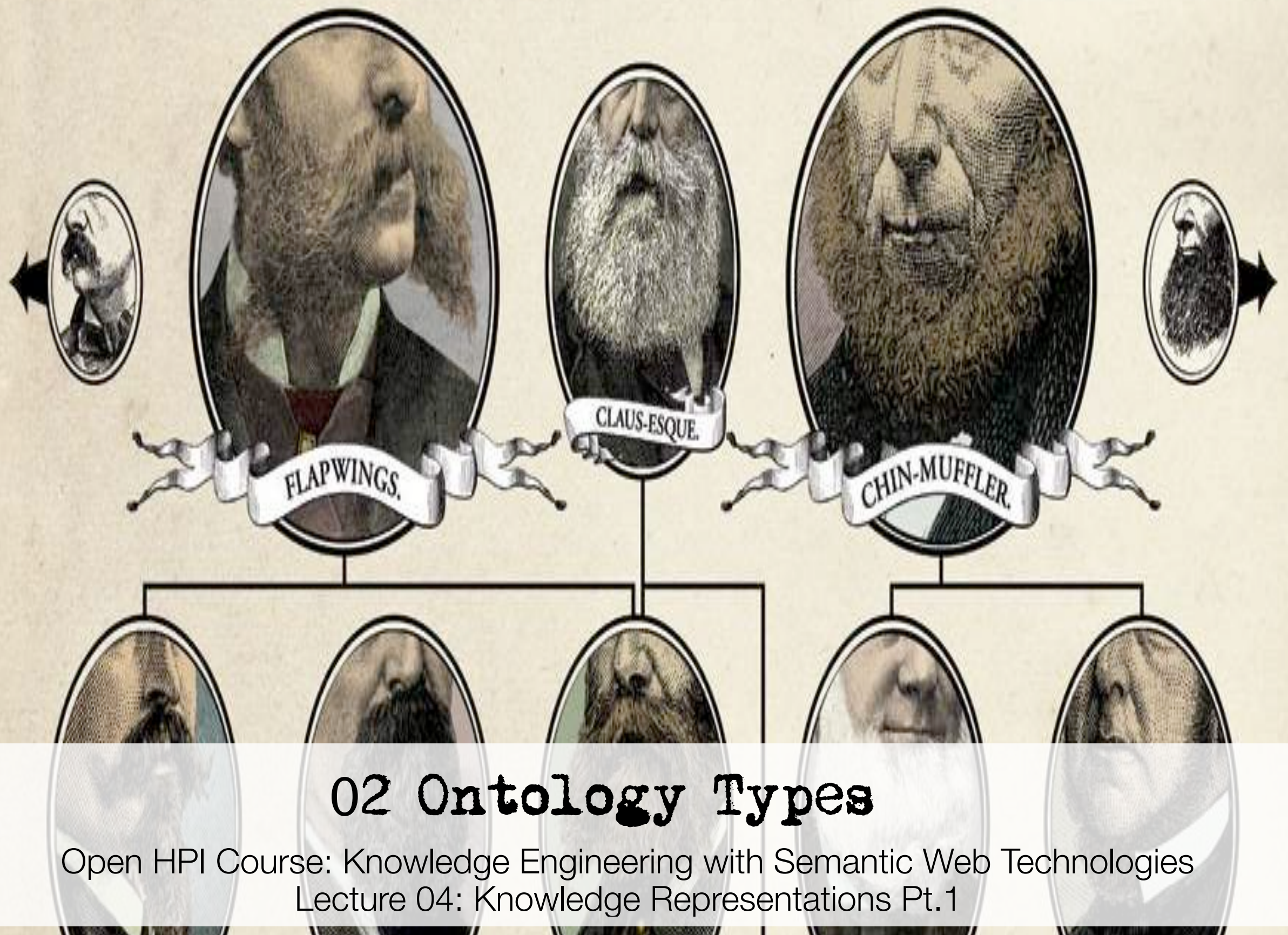
Dr. Harald Sack
Hasso-Plattner-Institut for IT Systems Engineering
University of Potsdam
Spring 2014



Lecture 4: Knowledge Representations I

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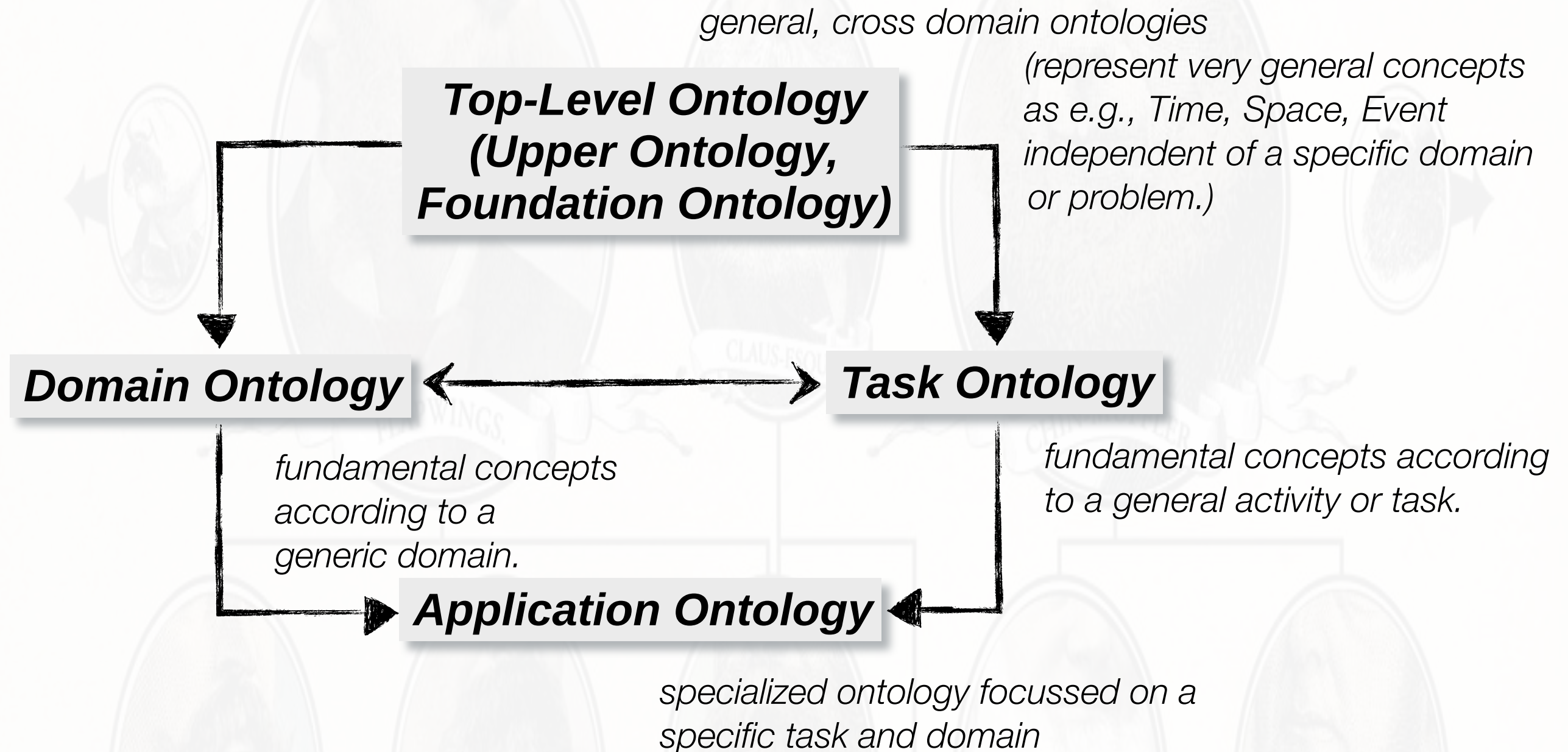
HIERARCHY OF BEARDS.



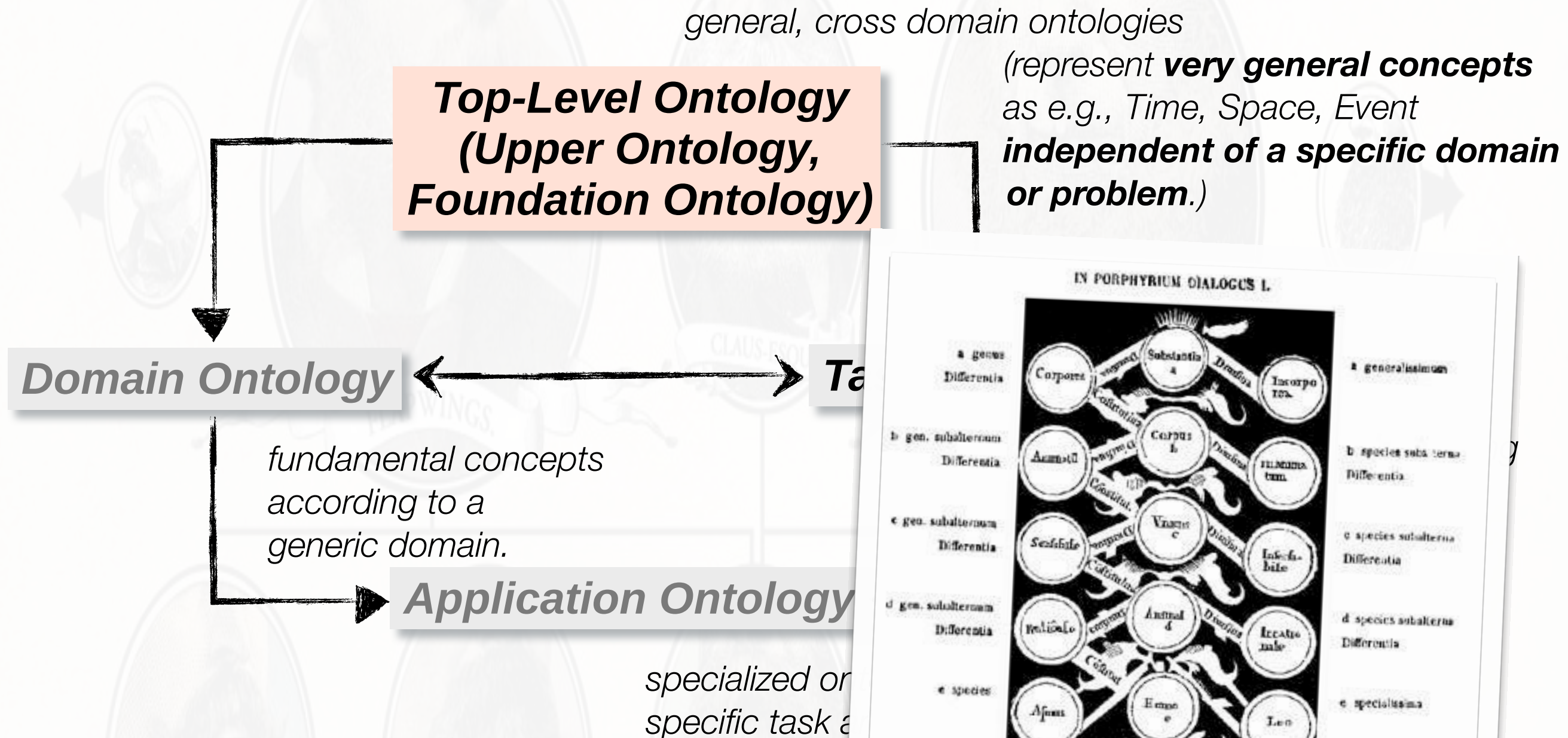
02 Ontology Types

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Lecture 04: Knowledge Representations Pt.1

Ontology Types and Categories

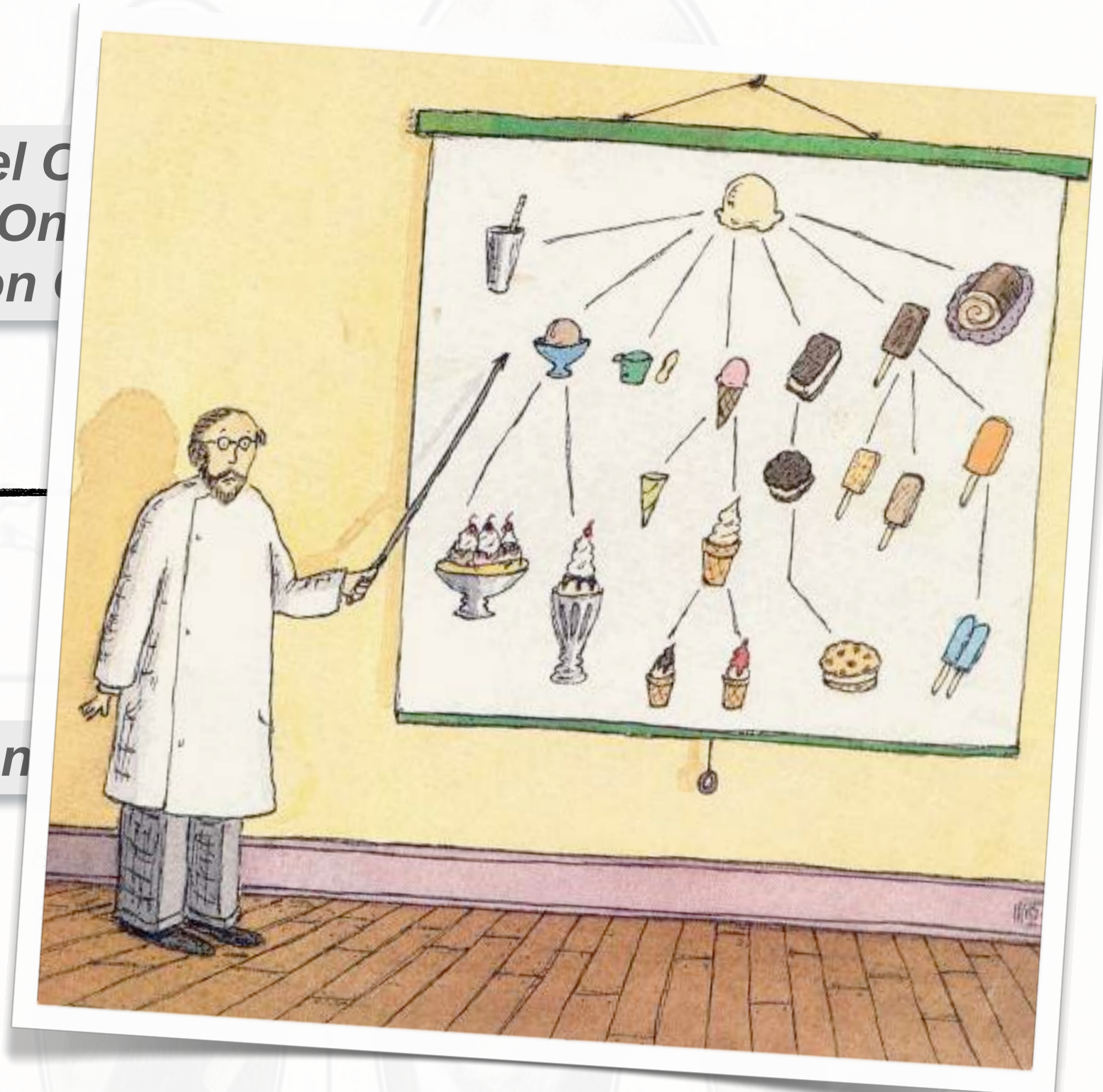
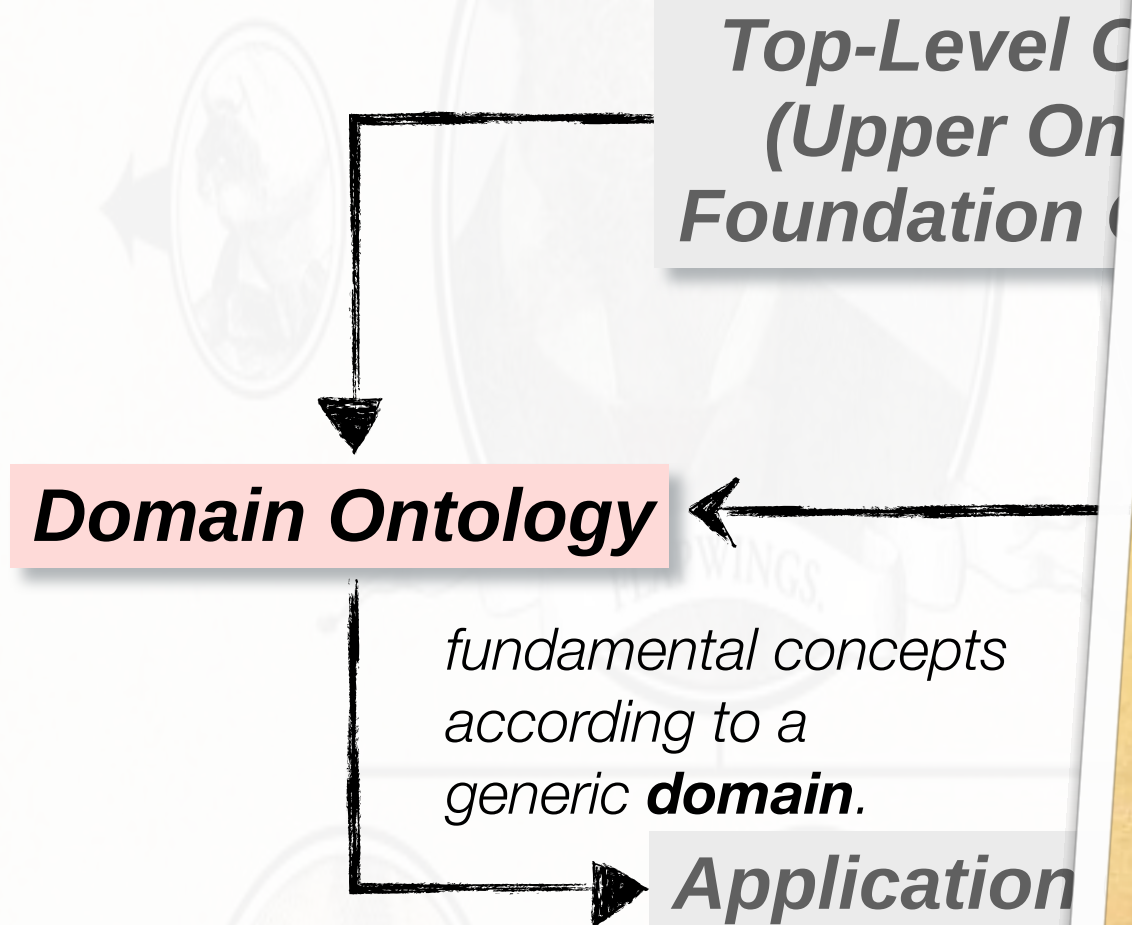


Ontology Types and Categories

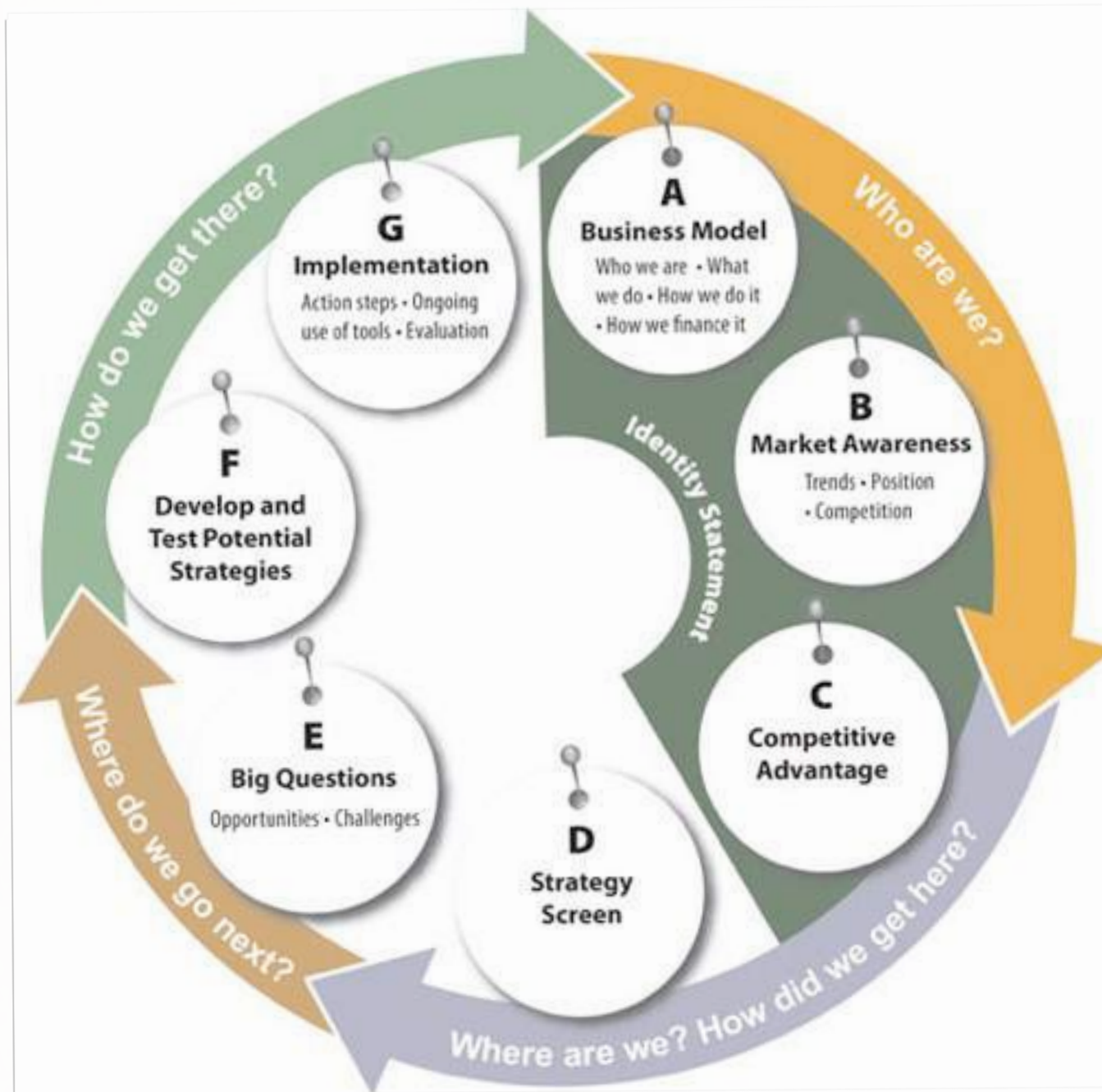


(according to Guarino, 1998)

Ontology Types and Categories



Ontology Types and Categories



cross domain ontologies

(represent very general concepts as e.g., Time, Space, Event independent of a specific domain or problem.)

gy
,
ogy)

Task Ontology

fundamental concepts according to a **general activity or task**.

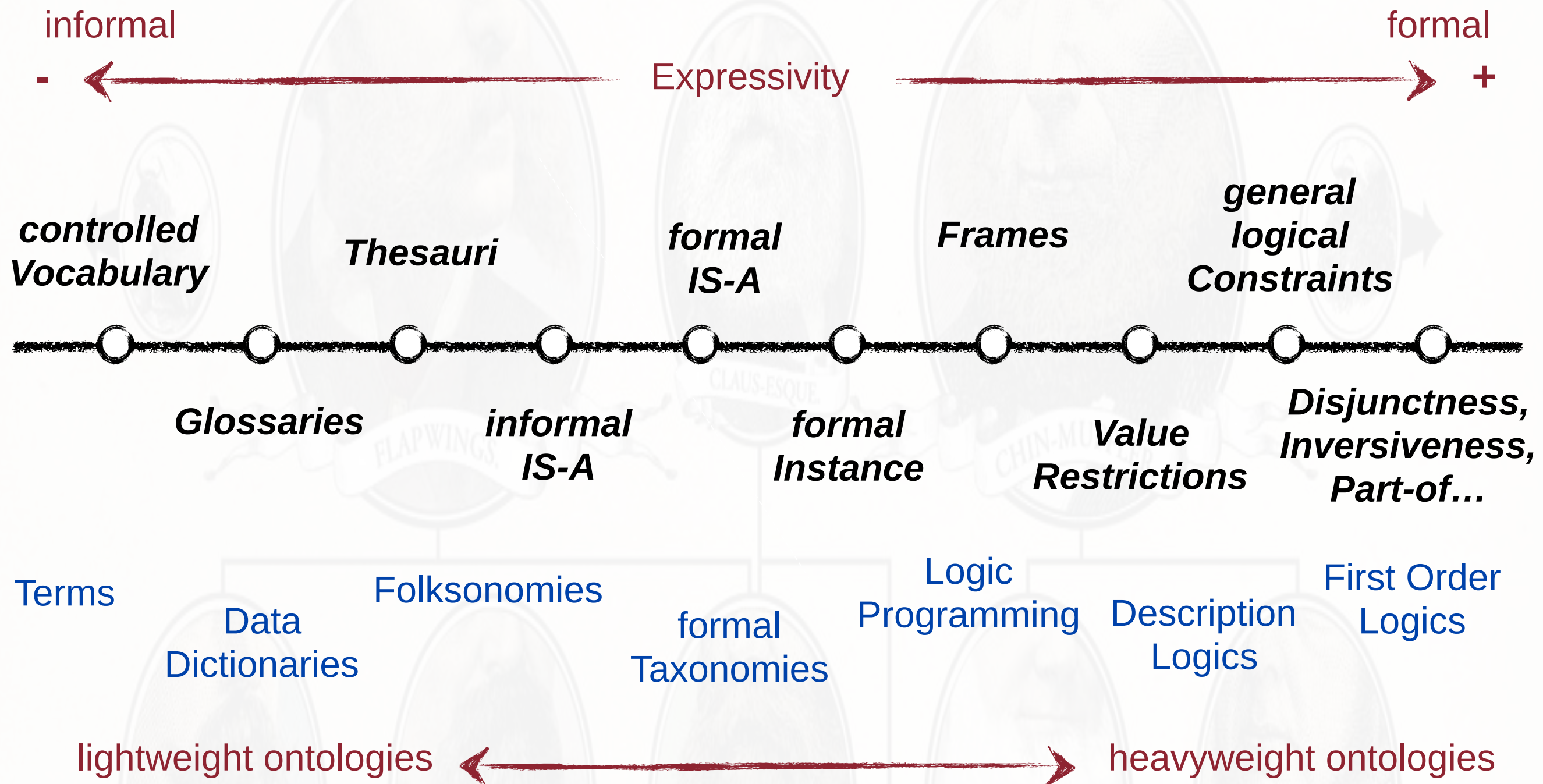
gy

ontology focussed on a task and domain

Ontology Types and Categories



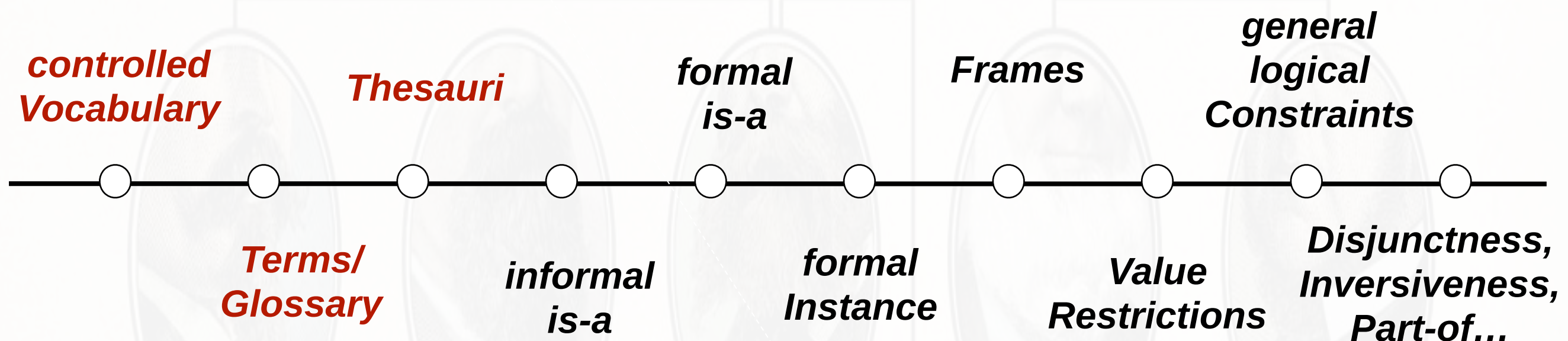
Ontology Types and Categories



(according to Lassila/McGuinness, 2001)

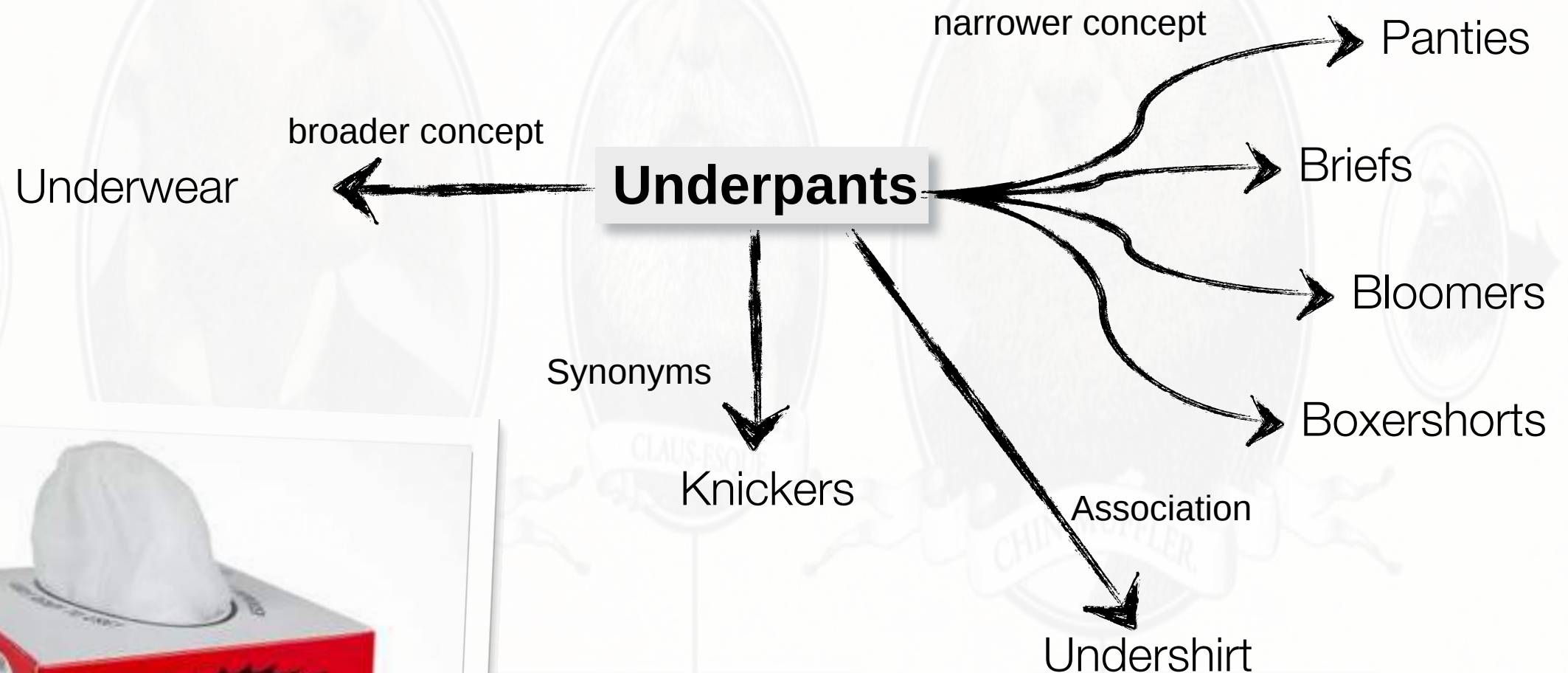
Ontology Types and Categories

- **Controlled Vocabulary:**
finite list of terms (e.g. catalogue)
- **Glossary:**
finite list of terms including an informal definition in natural language
- **Thesauri:** [greek. „treasure, treasure house“]
controlled vocabulary, concepts are connected via relations.
 - Equivalency (synonyms)
 - Hierarchies (subclasses, superclasses)
 - Homographs (Homonyms)
 - Associations (similar concepts)



Example of a Thesaurus Entry...

11

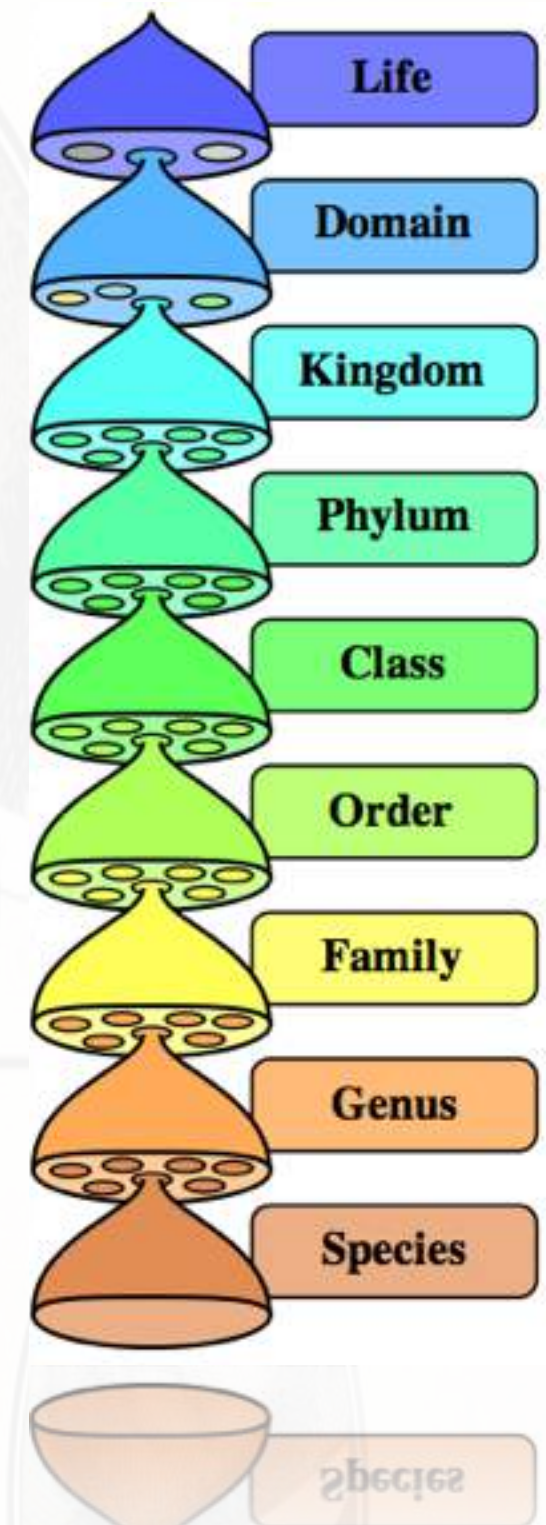


<http://frat.manmosh.com/category/home/>

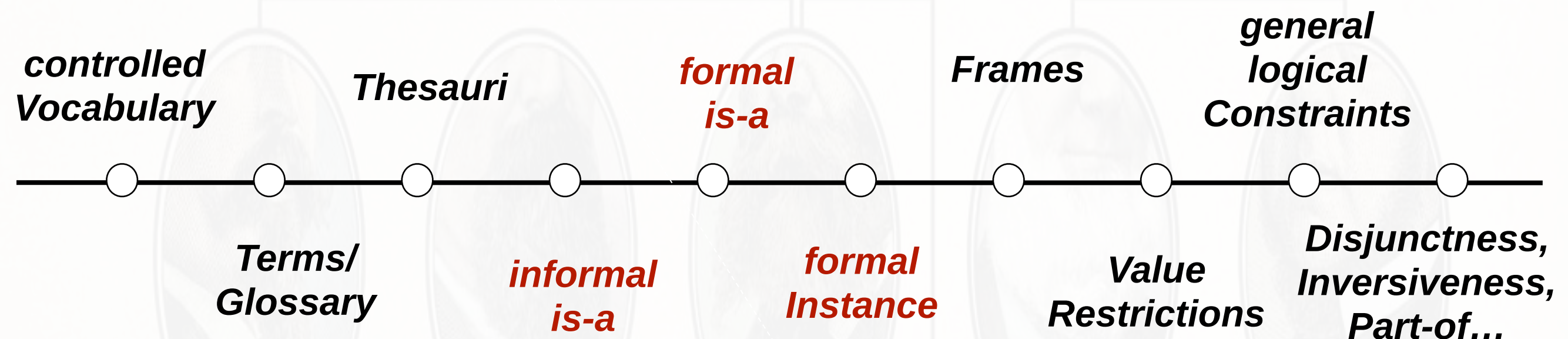
Taxonomies

Taxonomy: Definition of a hierarchical system of groups (from [greek] *τάξις* (*taxis*) = order, arrangement and *νόμος* (*nomos*) = law, science) ...

- also **classification schema**, nomenclature, ...
- in science most times classification into (mono-)hierarchical sets (classes, subclasses, ...)
- (also) subject of **biology**:
 - the arrangement of organisms into a classification according to similarities



- **informal IS-A-Hierarchy:**
explicite hierarchy of classes, subclass relations are not strict
(e.g. index of a library)
- **formal IS-A-Hierarchy:**
explicite hierarchy of classes, subclass relations are strict
- **formale instance:**
explicite class hierarchy, besides strict subclass relations also
instance-of relations are allowed





But, beware.....

15 various categories of animals from "a certain chinese encyclopedia" according to Jorge Luis Borges:

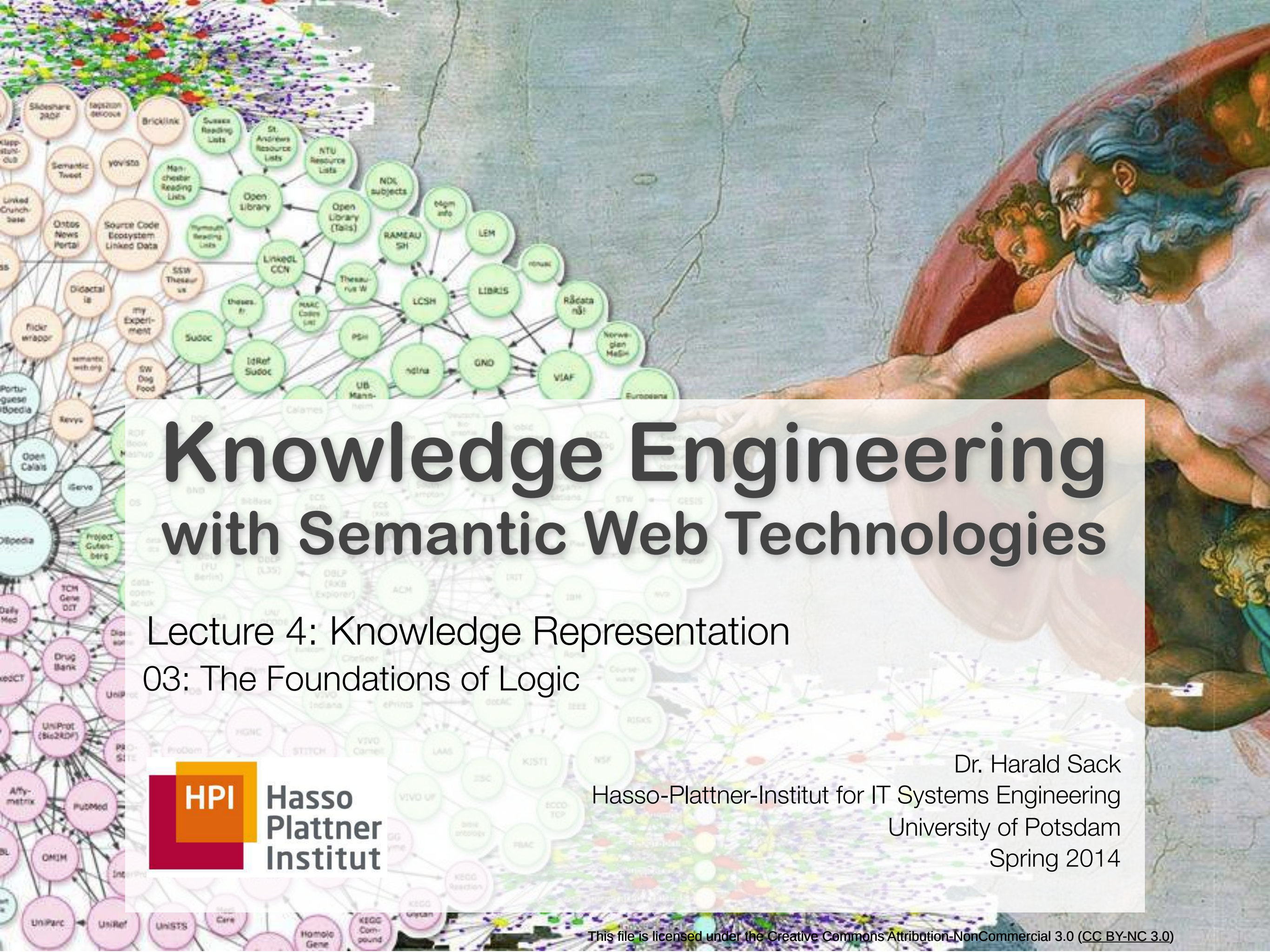
- THOSE THAT BELONG TO THE EMPEROR
- EMBALMED ONES
- THOSE THAT ARE TRAINED
- SUCKLING PIGS
- MERMAIDS (OR SIRENS)
- FABULOUS ONES
- STRAY DOGS
- THOSE THAT ARE INCLUDED IN THIS CLASSIFICATION
- THOSE THAT TREMBLE AS IF THEY WERE MAD
- INNUMERABLE ONES
- THOSE DRAWN WITH A VERY FINE CAMEL HAIR BRUSH
- ET CETERA
- THOSE THAT HAVE JUST BROKEN THE FLOWER VASE
- THOSE THAT, AT A DISTANCE, RESEMBLE FLIES





03 Foundations of Logic

Open HPI Course: Knowledge Engineering with Semantic Web Technologies
Lecture 04: Knowledge Representations Pt.1



Knowledge Engineering with Semantic Web Technologies

Lecture 4: Knowledge Representation 03: The Foundations of Logic



Dr. Harald Sack
Hasso-Plattner-Institut for IT Systems Engineering
University of Potsdam
Spring 2014



Lecture 4: Knowledge Representations I

Open HPI Course: Knowledge Engineering with Semantic Web Technologies



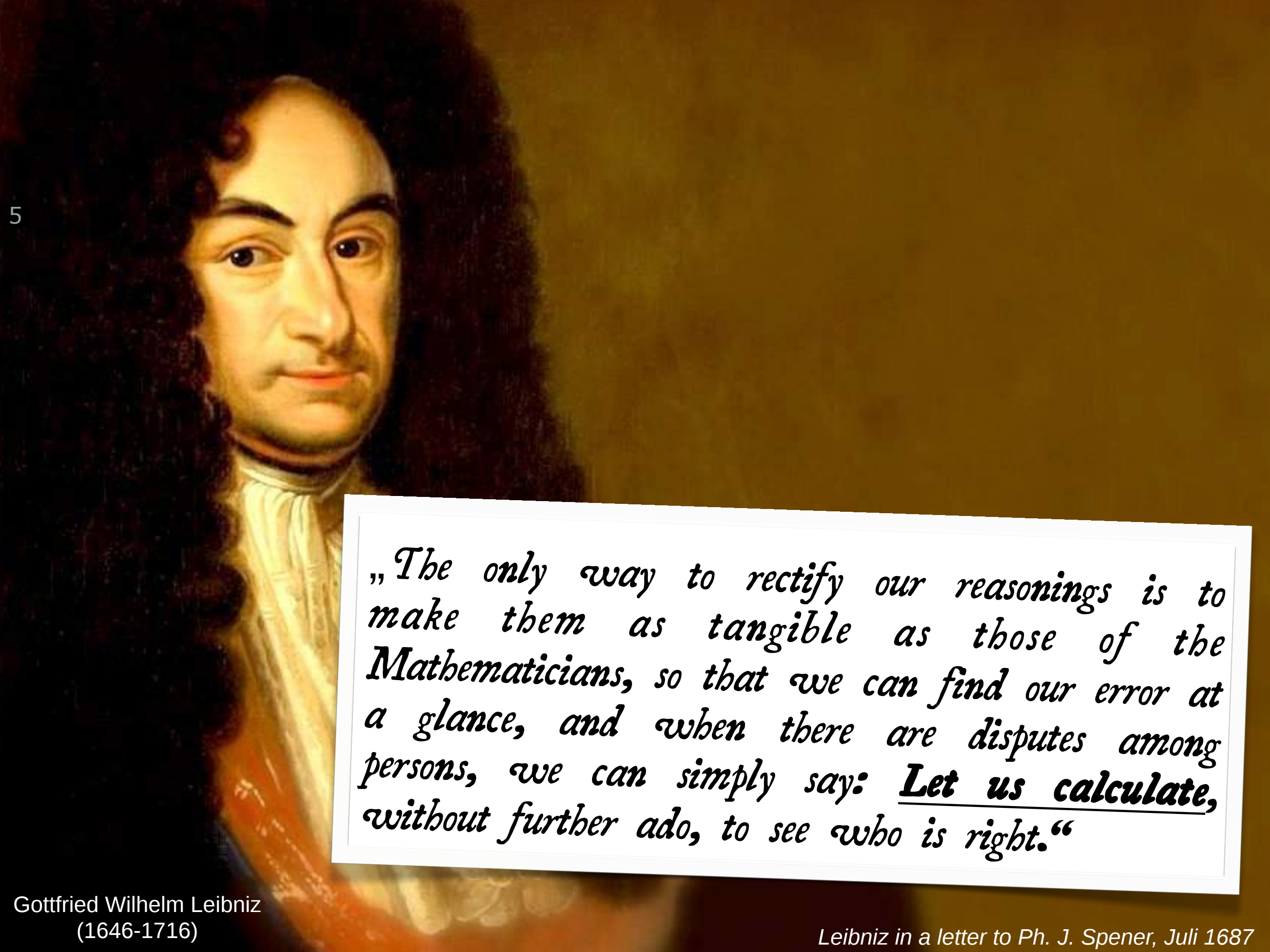
03 Foundations of Logic

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Lecture 04: Knowledge Representations Pt.1

Foundations of Logic

- 4
- Definition (for our lecture):

Logic is the study of how to make formal correct deductions and inferences.

A portrait of Gottfried Wilhelm Leibniz, a German philosopher, mathematician, and scientist. He is shown from the chest up, wearing a dark, curly wig and a white cravat. The background is a warm, brownish-gold color.

„The only way to rectify our reasonings is to make them as tangible as those of the Mathematicians, so that we can find our error at a glance, and when there are disputes among persons, we can simply say: Let us calculate, without further ado, to see who is right.“

- 6
- **Syntax:** *symbols without meaning*
defines rules, how to construct well-formed and valid sequences of symbols (strings)
 - **Semantic:** *meaning of syntax*
defines rules how the meaning of complex sequences of symbols can be derived from atomic sequences of symbols.

Syntax

```
If (i<0) then display ("negative account!")
```

*assignment of
meaning*

*print the message "negative account!", if
the account balance is negative*

Variants of Semantics

- E.g. programming languages

```
FUNCTION f(n:natural):natural;  
BEGIN  
    IF n=0 THEN f:=1  
    ELSE f:=n*f(n-1);  
END;
```

computation of the factorial

intentional semantics

Syntax

- „the meaning intended by the user“
- restricts the set of all possible models (meanings) to the meaning intended by the (human) user

Variants of Semantics

- E.g. programming languages

```
FUNCTION f(n:natural):natural;  
BEGIN  
    IF n=0 THEN f:=1  
    ELSE f:=n*f(n-1);  
END;
```

computation of the factorial

intentional semantics

$f : n \rightarrow n!$

formal semantics

Syntax

- aims to express the meaning of symbol sequences (programs) in a **formal language**, in a way that assertions over the symbol sequences (programs) can be proven by the application of deduction rules.

Variants of Semantics

- E.g. programming languages

```
FUNCTION f(n:natural):natural;  
BEGIN  
    IF n=0 THEN f:=1  
    ELSE f:=n*f(n-1);  
END;
```

computation of the factorial

intentional semantics

$f : n \rightarrow n!$

formal semantics

behaviour of the program at execution

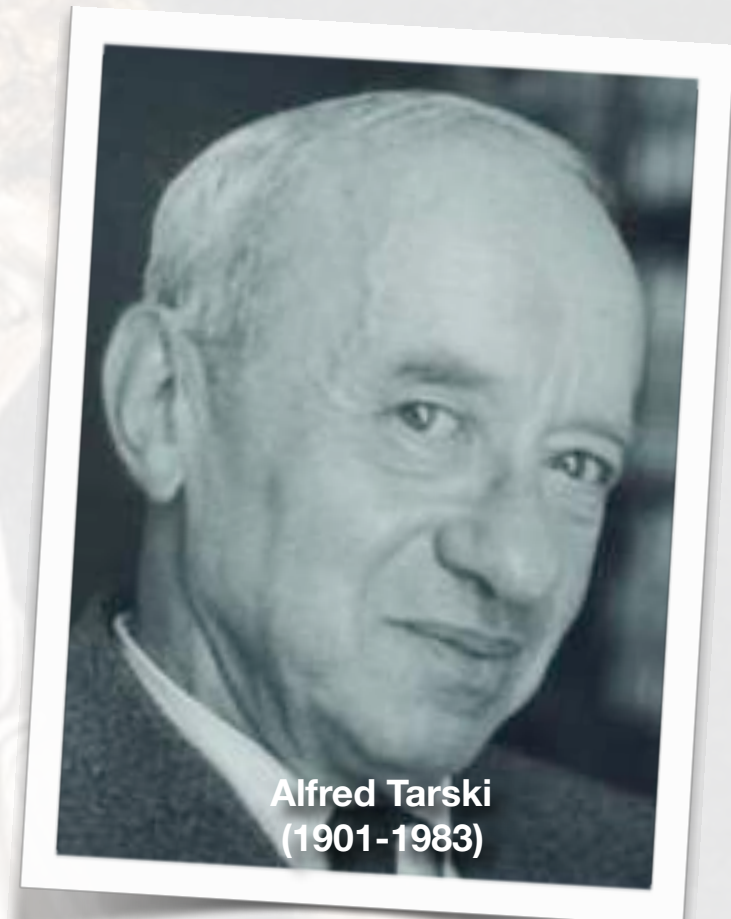
procedural semantics

- the meaning of a language expression (program) is the procedure that takes place internally, whenever the expression does occur.

Syntax

Model-theoretic Semantics

- **Model-theoretic semantics** performs the semantic interpretation of artificial and natural languages by
„identifying meaning with an exact and formally defined interpretation with a model“
- = formal Interpretation with a model
- e.g. model-theoretic semantics of propositional logic
 - assignment of truth values „*true*“ and „*false*“ to atomic assertions and
 - description of logical connectives with *truth tables*



Model-theoretic Semantics

11 ■ **Example:** the language of arithmetics

■ **Syntax:**

■ $x+2 \geq y$ is a formula

■ $x^2+y \geq$ is not a formula

■ **Semantics:**

■ $x+2 \geq y$ is **true** under the interpretation $x = 7, y = 1$

■ $x+2 \geq y$ is **not true** under the interpretation $x = 1, y = 7$

■ Inference/Entailment:

■ **Gaussian Elimination** is an algorithm for arithmetics.

Model-theoretic Semantics

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- Any logic $\mathbf{L} := (\mathbf{S}, \models)$ consists of
 - (1) a **set of statements** $\mathbf{S}$ and
 - (2) an **entailment relation** $\models$
- Let $\Phi \subseteq \mathbf{S}$ and $\varphi \in \mathbf{S}$: $\Phi \models \varphi$
- „ φ is a logical consequence of Φ “ or
„from the assertions of Φ follows the assertion φ “
- If for 2 assertions $\varphi, \psi \in \mathbf{S}$
both $\{\varphi\} \models \psi$ and $\{\psi\} \models \varphi$,
then both assertions φ and ψ are logically equivalent

$$\varphi \equiv \psi$$

Propositional Logic

logical connective	Name	intentional meaning
$\neg$	Negation	„not“
$\wedge$	Conjunction	„and“
$\vee$	Disjunction	„or“
$\rightarrow$	Implication	„if – then“
$\leftrightarrow$	Equivalence	„if, and only if, then“

- **Logical connectives:** $Op = \{ \neg, \wedge, \vee, \rightarrow, \leftrightarrow, (,) \}$, a set of symbols Σ with $\Sigma \cap Op = \emptyset$ and $\{\text{true}, \text{false}\}$
- Production rules for propositional formulae (propositions):
 - all atomic formulas are propositions (*all elements of Σ*)
 - if φ is a proposition, then also $\neg\varphi$
 - if φ and ψ are propositions, then also $\varphi \wedge \psi$, $\varphi \vee \psi$, $\varphi \rightarrow \psi$, $\varphi \leftrightarrow \psi$
- Priority: $\neg$ prior to $\wedge, \vee$ prior to $\rightarrow, \leftrightarrow$

- How to model facts?

Simple Assertions	Modeling
The moon is made of green cheese	g
It rains	r
The street is getting wet.	n

Composed Assertions	Modeling
if it rains, then the street will get wet.	$r \rightarrow n$
If it rains and the street does not get wet, then the moon is made of green cheese.	$(r \wedge \neg n) \rightarrow g$

■ Interpretation **I**:

Mapping of all atomic propositions to $\{t, f\}$.

- If F is a formula and I an Interpretation, then $I(F)$ is a truth value computed from F and I via truth tables.

$I(p)$	$I(q)$	$I(\neg p)$	$I(p \vee q)$	$I(p \wedge q)$	$I(p \rightarrow q)$	$I(p \leftrightarrow q)$
f	f	t	f	f	t	t
f	t	t	t	f	t	f
t	f	f	t	f	f	f
t	t	f	t	t	t	t

16

- We write $\mathbf{I} \models \mathbf{F}$, if $\mathbf{I}(\mathbf{F}) = \mathbf{t}$,
and call Interpretation $\mathbf{I}$ a **Model** of formula $\mathbf{F}$.
- Rules of Semantics:
 - $\mathbf{I}$ is model of $\neg\varphi$, iff $\mathbf{I}$ is not a model of φ
 - $\mathbf{I}$ is model of $(\varphi \wedge \psi)$, iff $\mathbf{I}$ is a model of φ AND of ψ
 - ...
- Basic concepts:
 - tautology
 - satisfiable
 - refutable
 - unsatisfiable (contradiction)

First Order Logic - FOL

17

Quantifier	Name	Intentional Meaning
$\exists$	Existential Quantifier	„it exists“
$\forall$	Universal Quantifier	„for all“

- **Operators (logical connectives)** as in propositional logic
- **Variables**, e.g., $X, Y, Z, \dots$
- **Constants**, e.g., $a, b, c, \dots$
- **Functions**, e.g., $f, g, h, \dots$ (incl. arity)
- **Relations / Predicates**, e.g., $p, q, r, \dots$ (incl. arity)

$$(\forall X)(\exists Y) ((p(X) \vee \neg q(f(X), Y)) \rightarrow r(X))$$

18 FOL: Syntax

- „correct“ formulation of **Terms** from Variables, Constants and Functions:

□ $f(X), g(a, f(Y)), s(a), .(H, T), x_location(Pixel)$

- „correct“ formulation of **Atoms** from Relations with Terms as arguments

□ $p(f(X)), q(s(a), g(a, f(Y))), add(a, s(a), s(a)),$
 $greater_than(x_location(Pixel), 128)$

- „correct“ formulation of **Formulas** from Atoms, Operators and Quantifiers:

□ $(\forall Pixel) (greater_than(x_location(Pixel), 128) \rightarrow red(Pixel))$

- If in doubt, use brackets!
- All Variables should be quantified!

- How to model facts?

- „All kids love icecream.”

- $\forall X: \text{Child}(X) \rightarrow \text{lovesIcecreme}(X)$

- „the father of a person is a male parent.”

- $\forall X \forall Y: \text{isFather}(X,Y) \leftrightarrow (\text{Male}(X) \wedge \text{isParent}(X,Y))$

- „There are (one or more) interesting lectures.”

- $\exists X: \text{Lecture}(X) \wedge \text{Interesting}(X)$

- „The relation ‚isNeighbor‘ is symmetric.”

- $\forall X \forall Y: \text{isNeighbor}(X,Y) \rightarrow \text{isNeighbor}(Y,X)$

■ Structure:

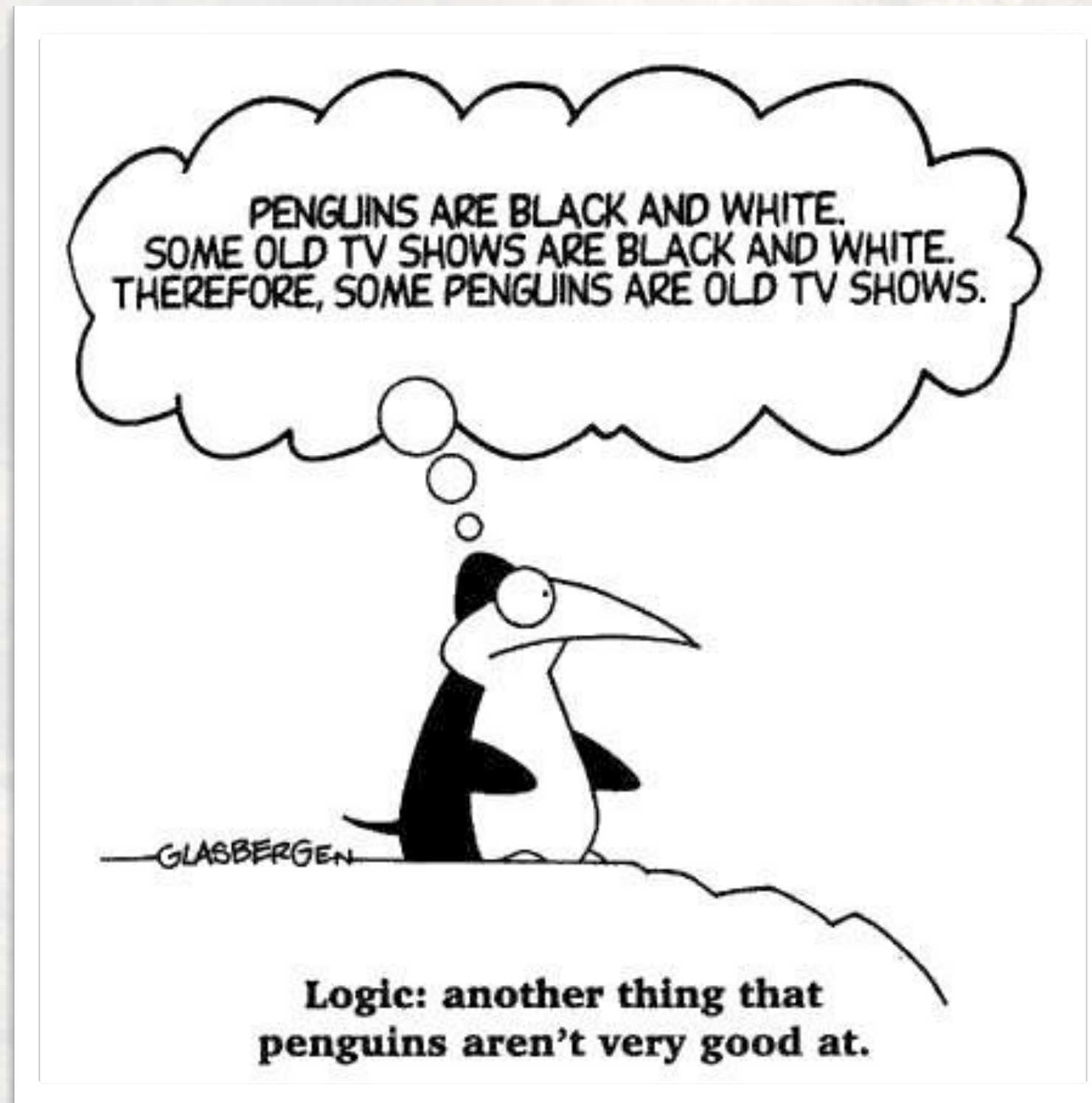
- Definition of a **domain D**.
- **Constant symbols** are mapped to elements of D.
- **Function symbols** are mapped to functions in D.
- **Relation symbols** are mapped to relations over D.

■ Then:

- **Assertions** will become elements of D.
- **Relation symbols** with arguments will become true or false.
- **Logical connectives** and **quantifiers** are treated likewise.

The Penguin Example...

21



■ The Penguin Example

$$\begin{aligned} & ((\forall X)(\text{penguin}(X) \rightarrow \text{blackandwhite}(X)) \\ & \wedge (\exists X)(\text{oldTVshow}(X) \wedge \text{blackandwhite}(X)) \\ &) \rightarrow (\exists X)(\text{penguin}(X) \wedge \text{oldTVshow}(X)) \end{aligned}$$

■ Intentional Semantics?

■ The Penguin Example

$$\begin{aligned} & ((\forall X)(\text{penguin}(X) \rightarrow \text{blackandwhite}(X)) \\ & \wedge (\exists X)(\text{oldTVshow}(X) \wedge \text{blackandwhite}(X)) \\ &) \rightarrow (\exists X)(\text{penguin}(X) \wedge \text{oldTVshow}(X)) \end{aligned}$$

■ Interpretation **I**:

- **Domain**: a set M , containing elements a, b .
- ... no constant or function symbols ...
- We show: the formula is *refutable* (i.e. it is not a tautology):
- If $I(\text{penguin})(a)$, $I(\text{blackandwhite})(a)$,
 $I(\text{oldTVshow})(b)$, $I(\text{blackandwhite})(b)$ is **true**,
 $I(\text{oldTVshow})(a)$ and $I(\text{penguin})(b)$ is **false**,
- then the formula with Interpretation **I** is **false**, d.h. **I** $\neq$ **F**

FOL - Logical Entailment

24

- a **theory** T is a set of formulas.
- an interpretation I is a **model** of T ,
iff $I \models G$ for all formulas G in T .
- a formula F is a **logical consequence** of T ,
iff all models of T are also models of F .
- then we write $T \models F$.
- two formulas F, G are called **logically equivalent**,
iff $\{F\} \models G$ and $\{G\} \models F$.
- then we write $F \equiv G$

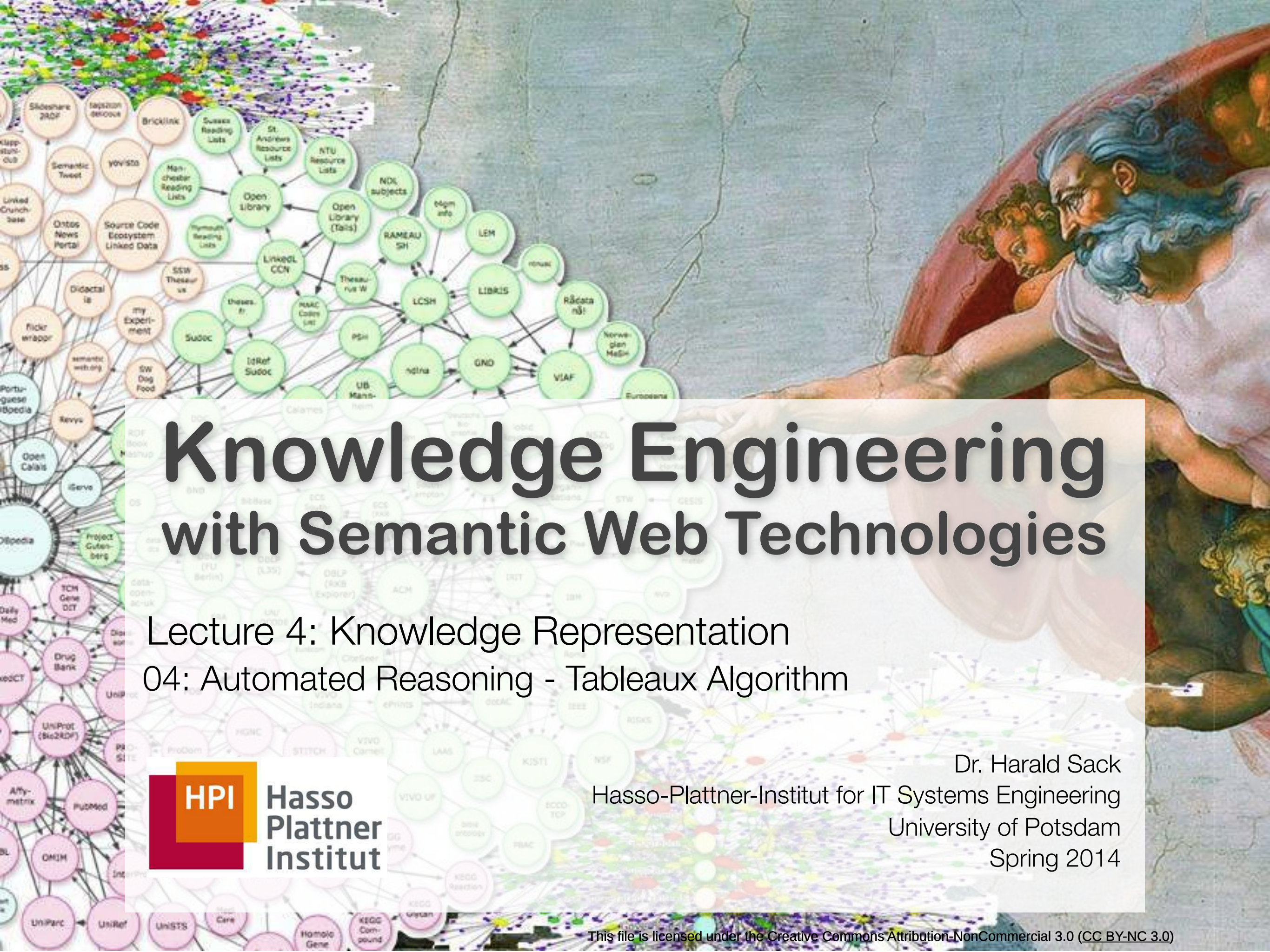
Theory $\triangleq$ Knowledge Base

Handwritten notes in German, likely related to the Tablaux algorithm. The text is written in a cursive style and appears to be a list of logical expressions or clauses, possibly representing a tableau expansion. The expressions are arranged in four rows, with some characters being repeated or crossed out, suggesting a process of simplification or elimination.

Spil T 57 Mai 31.9.22

04 Tablaux Algorithm for Automated Reasoning

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Lecture 04: Knowledge Representations Pt.1

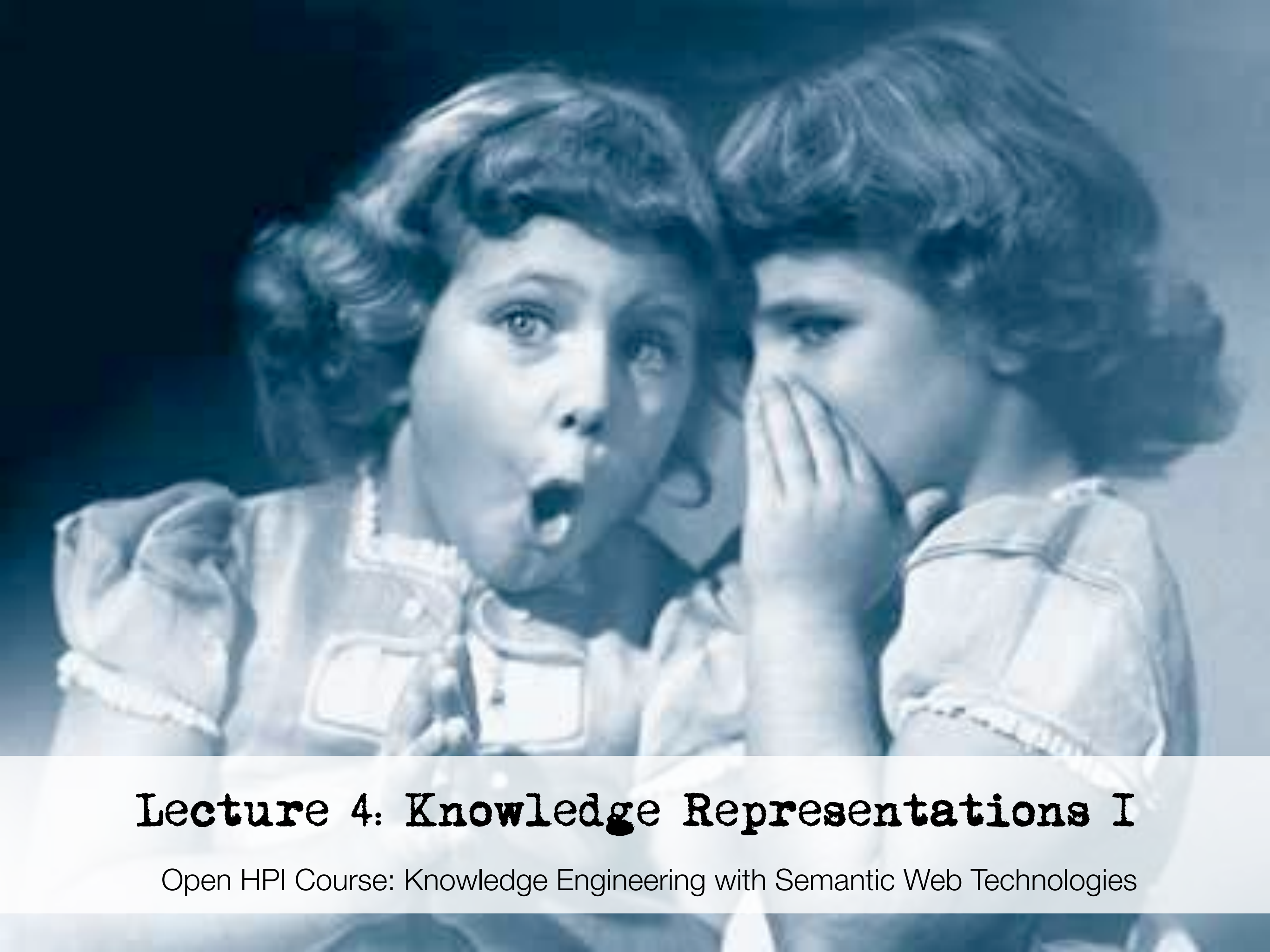


Knowledge Engineering with Semantic Web Technologies

Lecture 4: Knowledge Representation
04: Automated Reasoning - Tableaux Algorithm



Dr. Harald Sack
Hasso-Plattner-Institut for IT Systems Engineering
University of Potsdam
Spring 2014



Lecture 4: Knowledge Representations I

Open HPI Course: Knowledge Engineering with Semantic Web Technologies

Handwritten symbols and characters, possibly representing a sequence or a list, arranged in four rows. The symbols are stylized and appear to be a mix of letters and numbers, some with additional markings like dots or lines.

04 Automated Reasoning - Tableau Algorithm

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Lecture 04: Knowledge Representations Pt.1

Logical Equivalences



Augustus De Morgan
(1806-1871)

$$F \wedge G \equiv G \wedge F$$

$$F \vee G \equiv G \vee F$$

$$F \rightarrow G \equiv \neg F \vee G$$

$$F \leftrightarrow G \equiv (F \rightarrow G) \wedge (G \rightarrow F)$$

$$\neg(F \wedge G) \equiv \neg F \vee \neg G$$

$$\neg(F \vee G) \equiv \neg F \wedge \neg G$$

DeMorgans' Laws

$$\neg\neg F \equiv F$$

$$F \wedge t \equiv F$$

$$F \wedge f \equiv f$$

$$F \vee t \equiv t$$

$$F \vee f \equiv F$$

$$\neg(\forall X) F \equiv (\exists X) \neg F$$

$$\neg(\exists X) F \equiv (\forall X) \neg F$$

$$(\forall X)(\forall Y) F \equiv (\forall Y)(\forall X) F$$

$$(\exists X)(\exists Y) F \equiv (\exists Y)(\exists X) F$$

$$(\forall X) (F \wedge G) \equiv (\forall X) F \wedge (\forall X) G$$

$$(\exists X) (F \vee G) \equiv (\exists X) F \vee (\exists X) G$$

$$F \vee (G \wedge H) \equiv (F \vee G) \wedge (F \vee H)$$

$$F \wedge (G \vee H) \equiv (F \wedge G) \vee (F \wedge H)$$

Commutativity of Quantifiers

- Quantifiers (of the same sort) are commutative

$$\begin{aligned}(\forall X)(\forall Y) F &\equiv (\forall Y)(\forall X) F \\ (\exists X)(\exists Y) F &\equiv (\exists Y)(\exists X) F\end{aligned}$$

- But

$$(\exists X)(\forall Y) F \not\equiv (\forall Y)(\exists X) F$$

- Example:

- $(\exists x)(\forall y): \text{loves}(x, y)$

„There exists somebody, who loves everybody.“

- $(\forall y)(\exists x): \text{loves}(x, y)$

„Everybody is loved by somebody.“

Tableaux Algorithm

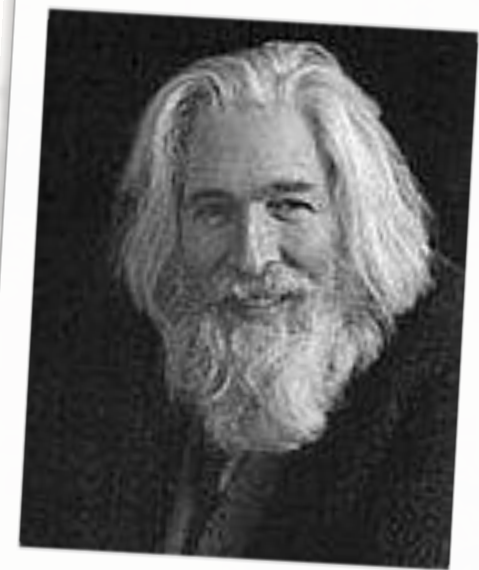


Evert Willem Beth
(1908-1964)

- For **automated reasoning**, we need syntactic algorithms to check the consistency of logical assertions
- The **method of analytical tableaux** is based on disjunctive normal form of logical expressions
 - invented by Dutch logician Evert Willem Beth in 1955 and simplified by Raymond Smullyan.

- **Basic Idea of Tableaux Algorithm:**

- Proof algorithm (decision procedure) to check the consistency of a logical formula by inferring that its negation is a contradiction (***proof by refutation***).



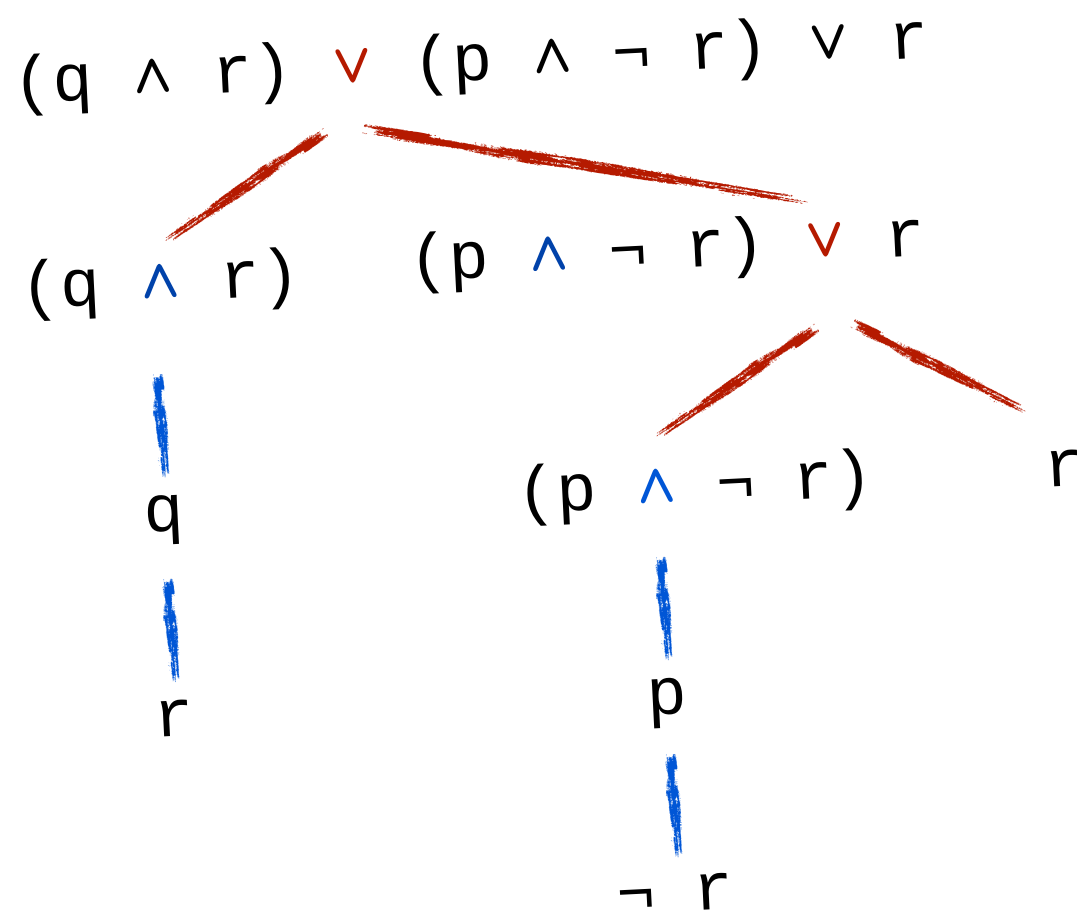
Raymond Merrill Smullyan

Beth, Evert W., 1955. "Semantic entailment and formal derivability", *Mededlingen van de Koninklijke Nederlandse Akademie van Wetenschappen, Afdeling Letterkunde*, N.R. Vol 18, no 13, 1955, pp 309–42.

Tableaux Algorithm for PL

(1) Construct **Decision Tree**, where each node is marked with a logical formula.

- A **path from the root to a leaf** is the **conjunction** of all formulas represented within the nodes of the path;
- a **branch of the path** represents a **disjunction**.



Tableaux Algorithm for PL

- 8
- (1) Construct **Decision Tree**, where each node is marked with a logical formula.
 - A **path from the root to a leaf** is the **conjunction** of all formulas represented within the nodes of the path;
 - a **branch of the path** represents a **disjunction**.
 - (2) The tree is created by successive application of the **Tableaux Extension Rules** (which are selected non deterministically).
 - (3) A **path** in the Tableaux is **closed**,
 - if along the path as well X as $\neg X$ for a formula X occurs (X doesn't have to be atomic) or
 - if **false** occurs .
 - (4) A tableaux is **fully expanded**, if no more extension rules can be applied.
 - (5) A tableaux is called **closed**, if all its paths are closed.
 - (6) A **Tableaux Proof** for a formula X is a closed tableaux for $\neg X$.

Tableaux Extension Rules for PL

- for PL:

$\frac{\neg\neg X}{X}$	$\frac{\neg T}{F}$	$\frac{\neg F}{T}$
------------------------	--------------------	--------------------

- for conjunctive Formula (α -Rules):

α	$X \wedge Y$	$\neg(X \vee Y)$	$\neg(X \Rightarrow Y)$
α_1	X	$\neg X$	X
α_2	Y	$\neg Y$	$\neg Y$

- for disjunctive formula (β -Rules):

β	$X \vee Y$	$\neg(X \wedge Y)$	$(X \Rightarrow Y)$
$\beta_1 \mid \beta_2$	X Y	$\neg X \mid \neg Y$	$\neg X \mid Y$

Tableaux Algorithm (PL) -Example1

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proof: $((q \wedge r) \Rightarrow (\neg q \vee r))$

α -Rule
 $\neg(X \Rightarrow Y)$
 X
 $\neg Y$

(1) $\neg((q \wedge r) \Rightarrow (\neg q \vee r))$

(2) $\alpha, 1: (q \wedge r)$

(3) $\alpha, 1: \neg(\neg q \vee r) = q \wedge \neg r$

Tableaux Algorithm (PL) -Example1

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proof: $((q \wedge r) \Rightarrow (\neg q \vee r))$

(1) $\neg((q \wedge r) \Rightarrow (\neg q \vee r))$

(2) $\alpha, 1: (q \wedge r)$

(3) $\alpha, 1: \neg(\neg q \vee r) = q \wedge \neg r$

α -Rule

X	$\wedge$	Y
X		
Y		

(4) $\alpha, 2: q$

(5) $\alpha, 2: r$

(6) $\alpha, 3: q$

(7) $\alpha, 3: \neg r$

- path is closed
- tableaux is closed

Tableaux Algorithm (PL) -Example2

proof: $(p \Rightarrow (q \Rightarrow r)) \Rightarrow ((p \Rightarrow q) \Rightarrow (p \Rightarrow r))$

α -Rule

$\neg(X \Rightarrow Y)$

X

$\neg Y$

(1) $\neg((p \Rightarrow (q \Rightarrow r)) \Rightarrow ((p \Rightarrow q) \Rightarrow (p \Rightarrow r)))$

(2| α from 1) $(p \Rightarrow (q \Rightarrow r))$

(3| α from 1) $\neg((p \Rightarrow q) \Rightarrow (p \Rightarrow r))$

(4| α from 3) $(p \Rightarrow q)$

(5| α from 3) $\neg(p \Rightarrow r)$

(6| α from 5) p

(7| α from 5) $\neg r$

Tableaux Algorithm (PL) -Example2

proof: $(p \Rightarrow (q \Rightarrow r)) \Rightarrow ((p \Rightarrow q) \Rightarrow (p \Rightarrow r))$

(1) $\neg((p \Rightarrow (q \Rightarrow r)) \Rightarrow ((p \Rightarrow q) \Rightarrow (p \Rightarrow r)))$

(2| α from 1) $(p \Rightarrow (q \Rightarrow r))$

(3| α from 1) $\neg((p \Rightarrow q) \Rightarrow (p \Rightarrow r))$

(4| α from 3) $(p \Rightarrow q)$

(5| α from 3) $\neg(p \Rightarrow r)$

(6| α from 5) p

(7| α from 5) $\neg r$

(8| β from 2) $\neg p$ | (9| β from 2) $(q \Rightarrow r)$

(10| β from 9) $\neg q$ | (11| β from 9) r

(12| β from 4) $\neg p$ | (13| β from 4) q

β -Rule

$(X \Rightarrow Y)$

$\neg X$ | Y

Tableaux Algorithm Extension (FOL)

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- as for propositional logic - X and Y stand for arbitrary (FOL) formulas
- Additional Rules for quantified formulas :

$$\frac{\gamma}{\gamma[t]}$$

$$\frac{\delta}{\delta[c]}$$

- γ for universally quantified formulas, δ existentially quantified formulas, with:

γ	$\gamma[t]$	δ	$\delta[c]$
$\forall x.\Phi$	$\Phi[x \leftarrow t]$	$\exists x.\Phi$	$\Phi[x \leftarrow c]$
$\neg \exists x.\Phi$	$\neg \Phi[x \leftarrow t]$	$\neg \forall x.\Phi$	$\neg \Phi[x \leftarrow c]$

- t is an arbitrary ground term
(i.e. doesn't contain variables that are bound in Φ),
- c is a „new“ constant

Tableaux Algorithm (FOL) -Example3

γ	$\gamma[t]$
$\forall x.\Phi$	$\Phi[x \leftarrow t]$
$\neg \exists x.\Phi$	$\neg \Phi[x \leftarrow t]$
δ	$\delta[c]$
$\exists x.\Phi$	$\Phi[x \leftarrow c]$
$\neg \forall x.\Phi$	$\neg \Phi[x \leftarrow c]$

Proof: $(\forall x . P(x) \vee Q(x)) \Rightarrow (\exists x . P(x)) \vee (\forall x . Q(x))$

(1) $\neg((\forall x . P(x) \vee Q(x)) \Rightarrow (\exists x . P(x)) \vee (\forall x . Q(x)))$

(2| α from 1) $(\forall x . P(x) \vee Q(x))$

(3| α from 1) $\neg((\exists x . P(x)) \vee (\forall x . Q(x)))$

(4| α from 3) $\neg(\exists x . P(x))$

(5| α from 3) $\neg(\forall x . Q(x))$

(6| δ from 5) $\neg Q(c)$

(7| γ from 4) $\neg P(c)$

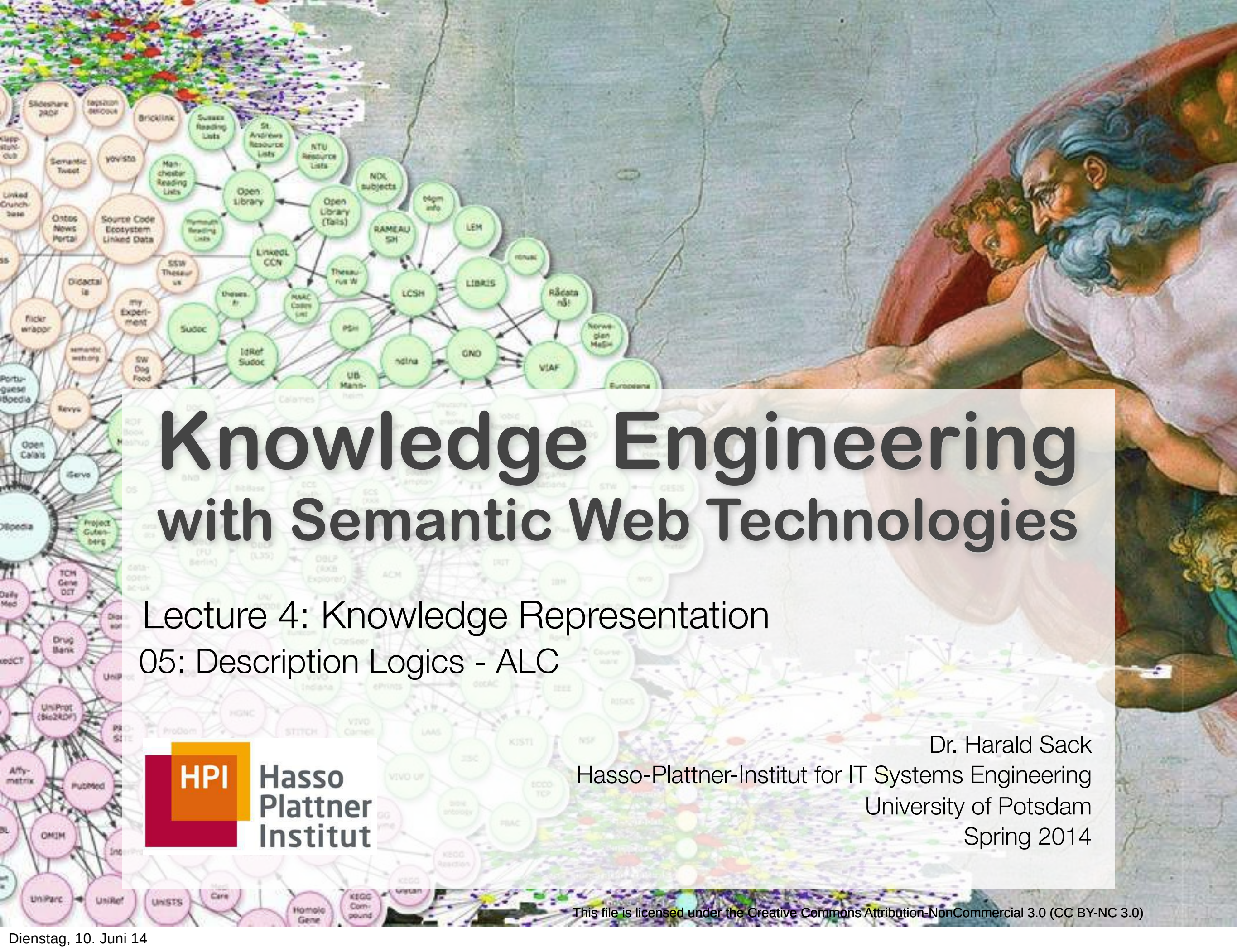
(8| γ from 2) $P(c) \vee Q(c)$

(9| β from 8) $P(c)$ | (10| β from 8) $Q(c)$



05 Description Logics - ALC

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Lecture 04: Knowledge Representations Pt.1



Knowledge Engineering with Semantic Web Technologies

Lecture 4: Knowledge Representation
05: Description Logics - ALC

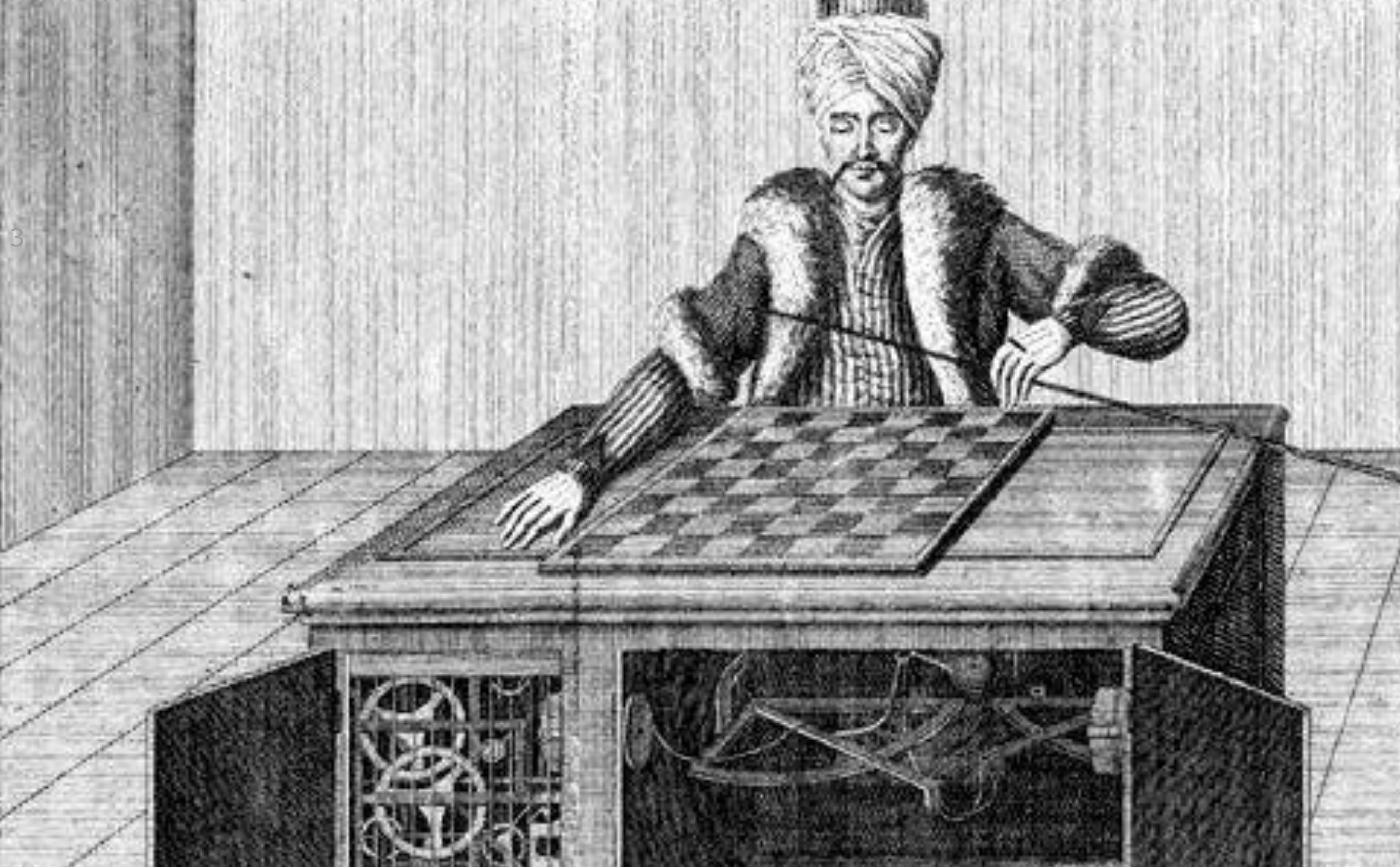


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05 Description Logics - ALC

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Lecture 04: Knowledge Representations Pt.1

- Why not simply take FOL for Ontologies?
- FOL can do everything...
 - *you could also program everything with assembler instead of with higher programming languages*
- FOL has
 - high **expressivity**
 - too **bulky** for modelling
 - not appropriate to find consensus in modelling
 - proof theoretically very **complex** (semi-decidable)
- *FOL is of course not a Markup Language for the Web*
 - ▶ Look for an appropriate fragment of FOL....
 - ▶ *...and then make it a vocabulary for RDF(S)*

- DLs are Fragments of FOL
- In DL from *simple descriptions* more *complex descriptions* are created with the help of **Constructors**.
- DLs differ in the applied constructors (Expressivity)
- DLs have been developed from „semantic Networks“
- DLs are **decidable** (most times)
- DLs possess **sufficient expressivity** (most times)
- DLs are related to modal logics
- e.g.,
W3C Standard OWL 2 DL is based on description logics
 $\mathcal{SHROIQ}(\mathcal{D})$

Knowledge Base

TBox Terminological Knowledge

Knowledge about concepts of a domain
(classes, attributes, properties,..)

`Writer  $\equiv$  Person  $\sqcap$   $\exists$ author.Book`

ABox Assertional Knowledge

Knowledge about Individuals / Entities

`Writer(GeorgeOrwell)`

Inference Engine

Interface

- DLs are a **family** of logic-based formalisms applied for knowledge representation
- Special languages characterized by:
 - **Constructors** for complex concepts and roles from simpler concepts and roles
 - Set of **Axioms** to express Facts about concepts, roles and individuals
 - ***ALC** (Attribute Language with Complement)* is the smallest deductively complete DL
 - Conjunction, Disjunction, Negation are class constructors, denoted as $\sqcap$, $\sqcup$, $\neg$
 - Quantifiers restrict domain and range of roles

Attributive Language with Complements $\mathcal{ALC}$

8 Building Blocks:

- Classes
- Roles / Properties
- Individuals
- **Writer(GeorgeOrwell)**
Individual GeorgeOrwell is of class Writer
- **Book(NineteenEightyfour)**
Individual NineteenEightyfour is of class Book
- **author(NineteenEightyfour, GeorgeOrwell)**
The book NineteenEightyfour has the author GeorgeOrwell

- **Atomic Types**
 - Concept names $A, B, \dots$
 - Special concepts
 - $\top$ - Top (universal concept)
 - $\perp$ - Bottom concept
 - Role names $R, S, \dots$
- **Constructors**
 - Negation: $\neg C$
 - Conjunction: $C \sqcap D$
 - Disjunction: $C \sqcup D$
 - Existential quantifier: $\exists R. C$
 - Universal quantifier: $\forall R. C$

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- **Class Inclusion**

- $\text{Novel} \sqsubseteq \text{Book}$

- *every novel is also a book*
- equals $(\forall x)(\text{Novel}(x) \rightarrow \text{Book}(x))$

- **Class Equivalence**

- $\text{Novel} \equiv \text{Prose}$

- *all Prose are exactly Novels*
- equals $(\forall x)(\text{Novel}(x) \leftrightarrow \text{Prose}(x))$

- Conjunction $\sqcap$
- Disjunction $\sqcup$
- Negation $\neg$

$\text{Novel} \sqsubseteq (\text{Book} \sqcap \text{Fiction})$
 $\sqcup (\text{Paperback} \sqcap \neg \text{Poetry})$

$(\forall x)(\text{Novel}(x) \rightarrow ((\text{Book}(x) \wedge \text{Fiction}(x))$
 $\vee (\text{Paperback}(x) \wedge \neg \text{Poetry}(x))))$

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- **Strict Binding** of the Range of a Role to a Class

- $\text{Book} \sqsubseteq \forall \text{author} . \text{Writer}$

- *A Book must be authored by a Writer*

- $(\forall x)(\text{Book}(x) \rightarrow (\forall y)(\text{author}(x,y) \rightarrow \text{Writer}(y)))$

- **Open Binding** of the Range of a Role to a Class

- $\text{Book} \sqsubseteq \exists \text{author} . \text{Person}$

- *Every Book has at least one author (who is a person)*

- $(\forall x)(\text{Book}(x) \rightarrow (\exists y)(\text{author}(x,y) \wedge \text{Person}(y)))$

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- Production rules for creating classes in $\mathcal{ALC}$:

(A is an atomic class, C and D are complex Classes and R a Role)

$$\bullet C, D ::= A \mid \top \mid \perp \mid \neg C \mid C \sqcap D \mid C \sqcup D \mid \exists R.C \mid \forall R.C$$

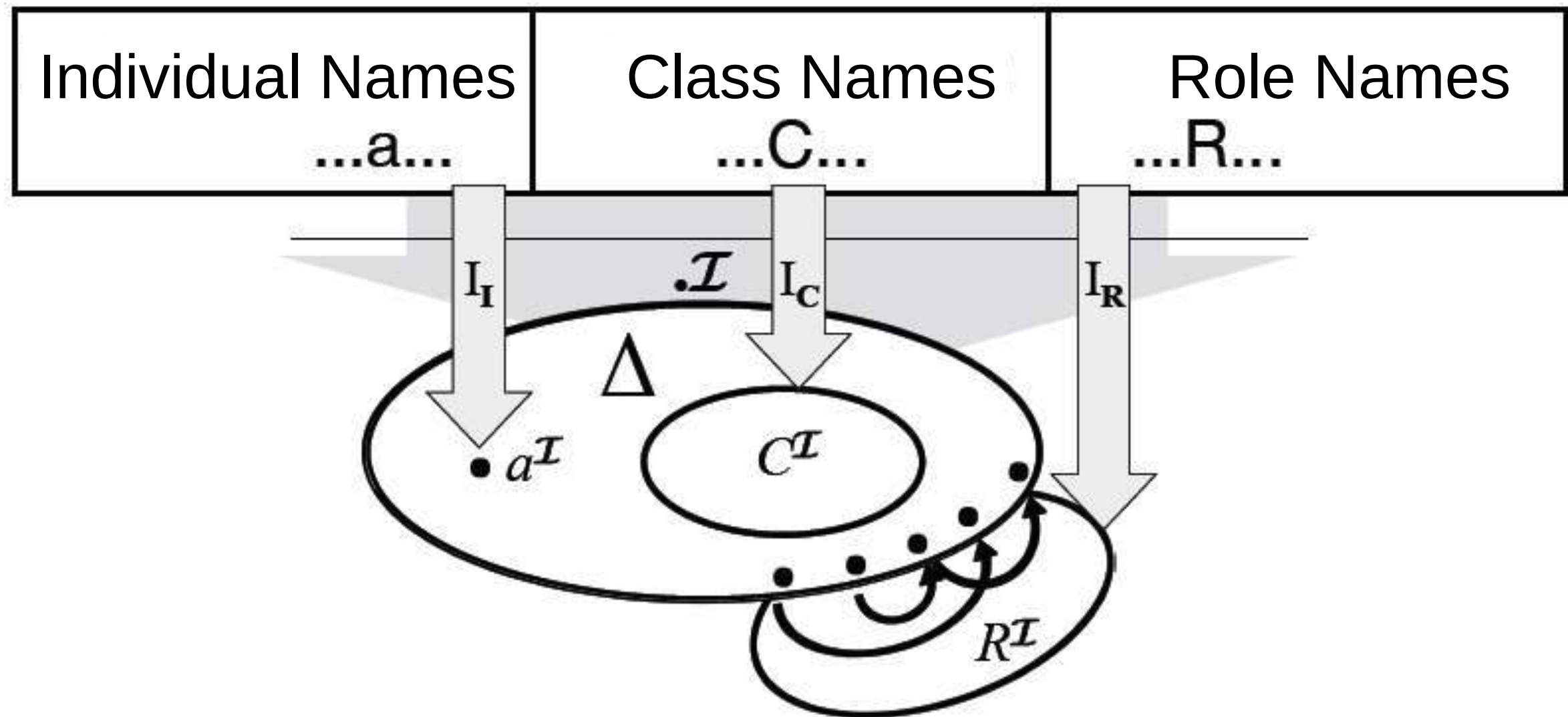
- An $\mathcal{ALC}$ **TBox** contains assertions of the form $C \sqsubseteq D$ and $C \equiv D$, where C, D are complex classes.
- An $\mathcal{ALC}$ **ABox** contains assertions of the form $C(a)$ and $R(a, b)$, where C is a complex Class, R a Role and a, b Individuals.
- An $\mathcal{ALC}$ -**Knowledge Base** contains an ABox and a TBox.

$\mathcal{ALC}$ - Semantic (Interpretation)

- we define a model-theoretic semantic for $\mathcal{ALC}$
(i.e. *Entailment will be defined via Interpretations*)
- an **Interpretation** $\mathcal{I} = (\Delta^{\mathcal{I}}, \cdot^{\mathcal{I}})$ contains
 - a set $\Delta^{\mathcal{I}}$ (**Domain**) of Individuals and
 - an **interpretation function** $\cdot^{\mathcal{I}}$ that maps
 - Individual names a
to domain elements $a^{\mathcal{I}} \in \Delta^{\mathcal{I}}$
 - Class names C
to a set of domain elements $C^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}}$
 - Role names R
to a set of pairs of domain elements $R^{\mathcal{I}} \subseteq \Delta^{\mathcal{I}} \times \Delta^{\mathcal{I}}$

$\mathcal{ALC}$ - Semantic (Interpretation)

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- Extension (of Interpretation $\mathbf{I}$) for complex classes:

- $\top^{\mathbf{I}} = \Delta^{\mathbf{I}}$ and $\perp^{\mathbf{I}} = \emptyset$
- $(C \sqcup D)^{\mathbf{I}} = C^{\mathbf{I}} \cup D^{\mathbf{I}}$ and
 $(C \sqcap D)^{\mathbf{I}} = C^{\mathbf{I}} \cap D^{\mathbf{I}}$
- $(\neg C)^{\mathbf{I}} = \Delta^{\mathbf{I}} \setminus C^{\mathbf{I}}$
- $\forall R. C = \{a \in \Delta^{\mathbf{I}} \mid (\forall b \in \Delta^{\mathbf{I}}) ((a, b) \in R^{\mathbf{I}} \rightarrow b \in C^{\mathbf{I}})\}$
- $\exists R. C = \{a \in \Delta^{\mathbf{I}} \mid (\exists b \in \Delta^{\mathbf{I}}) ((a, b) \in R^{\mathbf{I}} \wedge b \in C^{\mathbf{I}})\}$

$\mathcal{ALC}$ - Semantic (Interpretation)

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- ...and Axioms:

- $C(a)$ holds, iff $a^I \in C^I$
- $R(a, b)$ holds, iff $(a^I, b^I) \in R^I$
- $C \sqsubseteq D$ holds, iff $C^I \subseteq D^I$
- $C \equiv D$ holds, iff $C^I = D^I$

ALC - Knowledgebase

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- **Terminological Knowledge (TBox)**

Axioms that describe the Structure of the modelled domain (conceptual Schema):

- $\text{Writer} \sqsubseteq \exists \text{author}.\text{Book}$
- $\text{ScienceFictionNovel} \equiv \text{Novel} \sqcap \exists \text{literaryGenre}.\text{ScienceFiction}$

- **Assertional Knowledge (ABox)**

Axioms that describe specific situations (data):

- $\text{Writer}(\text{GeorgeOrwell})$
- $\text{author}(\text{NineteenEightyfour}, \text{GeorgeOrwell})$

Description Logics

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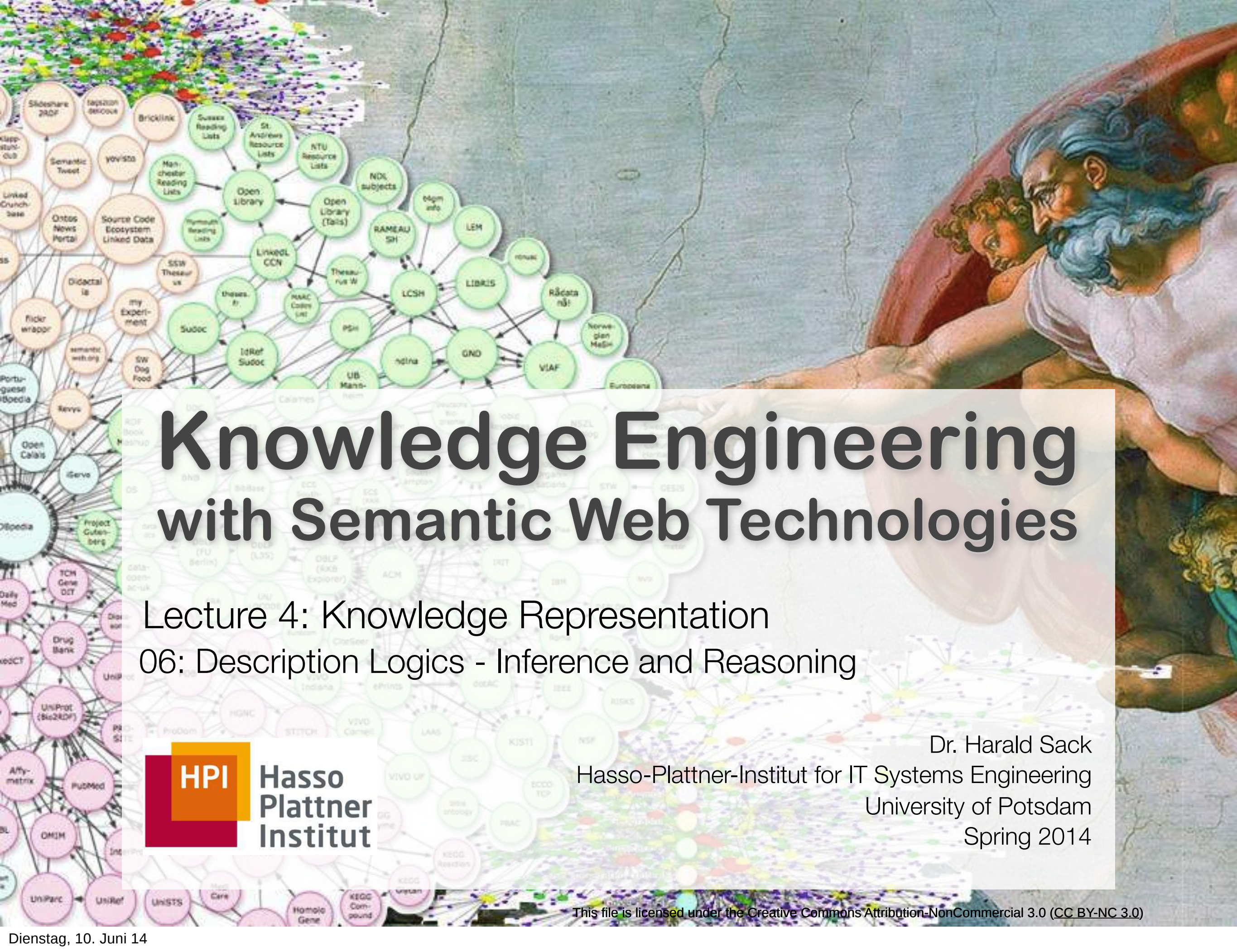
Operator/Constructor	Syntax	Language			
Conjunction	$A \sqcap B$	FL	S*		
Value Restriction	$\forall R.C$				
Existential Quantifier	$\exists R$				
Top	$\top$	AL*		S*	
Bottom	$\perp$				
Negation	$\neg A$				
Disjunction	$A \sqcup B$				
Existential Restriction	$\exists R.C$				
Number Restriction	$(\leq nR) (\geq nR)$				
Set of Inviduals	$\{a_1, \dots, a_2\}$				
Role Hierarchy	$R \sqsubseteq S$	H			
inverse Role	R^{-1}	I			
Qualified Number Restriction	$(\leq nR.C) (\geq nR.C)$	Q			

- $\mathcal{ALC}$: Attribute Language with Complement
- $\mathcal{S}$: $\mathcal{ALC}$ + Transitivity of Roles
- $\mathcal{H}$: Role Hierarchies
- $\mathcal{O}$: Nominals
- $\mathcal{I}$: Inverse Roles
- $\mathcal{N}$: Number restrictions $\leq n R$ etc.
- $\mathcal{Q}$: Qualified number restrictions $\leq n R.C$ etc.
- $(\mathcal{D})$: Datatypes
- $\mathcal{F}$: Functional Roles
- $\mathcal{R}$: Role Constructors
- OWL 2 DL is $\mathcal{SHRO1Q}(\mathcal{D})$



06 DL Inference and Reasoning

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Lecture 04: Knowledge Representations Pt.1



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Lecture 4: Knowledge Representation
06: Description Logics - Inference and Reasoning



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Hasso-Plattner-Institut for IT Systems Engineering
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06 DL Inference and Reasoning

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Lecture 04: Knowledge Representations Pt.1

Open World Assumption - OWA

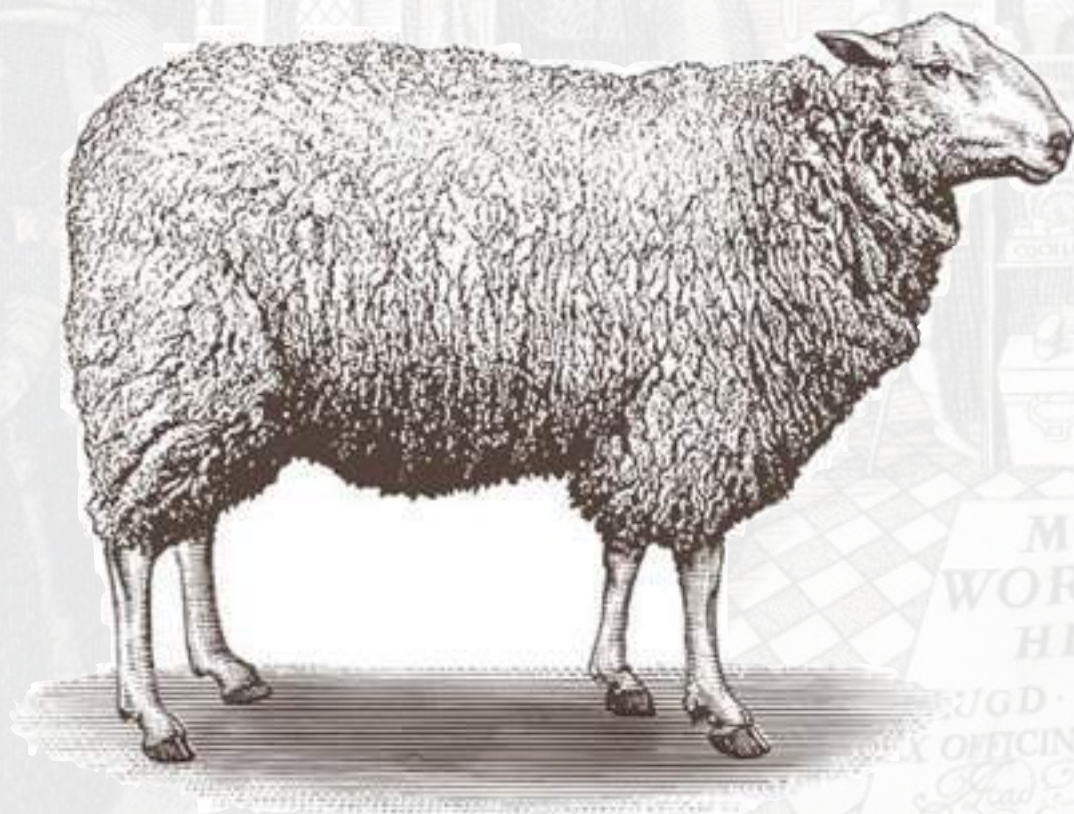
- When we have an **empty** DL ontology, **everything is possible**
- We then **constrain an ontology iteratively**, making it more restrictive as we go
- We state what is **not possible**, what is **forbidden** or **excluded**



Sheep $\sqsubseteq$ Animal $\sqcap \neg \text{hasLimbs.Leg}$

Open World Assumption - OWA

- Can Sheep fly? $\text{Sheep} \sqsubseteq \text{Animal} \sqcap \forall \text{hasLimbs}.\text{Leg}$
- No idea, but **probably yes** (according to our knowledge base)
- In the OWA, unless we have a statement (or we can infer) “*sheep can/cannot fly*” we return “***don't know***”
- In the real world, we are used to deal with incomplete information



Open World Assumption - OWA

- In the Semantic Web we expect people to extend our own models
(but we don't worry in advance how)
- The OWA assumes incomplete information by default
- Therefore, we can intentionally underspecify our models and allow others to reuse and extend

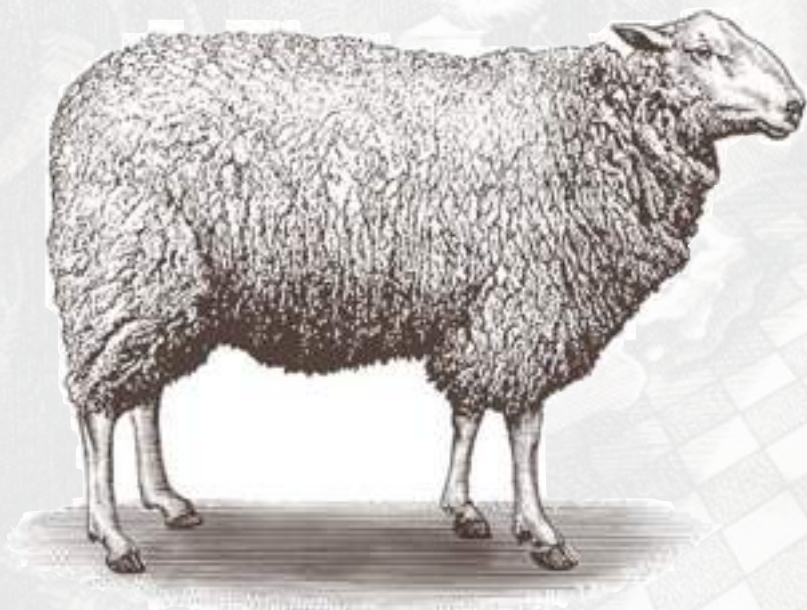
Sheep $\sqsubseteq$ Animal $\sqcap \forall \text{hasLimbs.Leg} \sqcap \text{canFly}$

further extension possible



Closed World Assumption - CWA

- Closed World Systems require a place to put everything
- You can't say anything until there's somewhere to say it, as e.g. a slot on a frame, field on an OO class, column in a DB
- In Close World Systems, we state **what is possible** and **have to specify all knowledge**
- the CWA holds that **anything that cannot be shown to be true is false**; no explicit declaration of falsehood is needed.



Sheep $\sqsubseteq$ Animal $\sqcap$ $\forall$ hasLimbs.Leg

Sheep can't fly!

Open World vs. Closed World Assumption

• OWA: Open World Assumption

The existence of further individuals is possible, if they are not explicitly excluded.

• CWA: Closed World Assumption

It is assumed that the knowledge base contains all individuals.

	<i>are all children of Bill male?</i>	<i>no idea since we do not know all children of Bill</i>	<i>if we assume that we know everything about Bill then all of his children are male</i>
child(Bill, Bob) Man(Bob)	$? \models \forall \text{child}.\text{Man}(\text{Bill})$	DL answers don't know	PROLOG answers yes
≤ 1 child.$\top$(Bill)	$? \models \forall \text{child}.\text{Man}(\text{Bill})$	yes	<i>now we know everything about Bill's children</i>

Problems of Inference (1)

- Global (In)Consistency of the knowledge base
 - *Does the knowledge base make sense?* $KB \models \perp?$
- Class(in)consistency
 - *Must class C be empty?* $C \equiv \perp?$
- Class inclusion (Subsumption)
 - *Structuring the knowledge base* $C \sqsubseteq D?$
- Class equivalency
 - *Are two classes the same?* $C \equiv D?$

Problems of Inference (1)

- Class disjointiveness
 - *Are two classes disjointive?*

$$C \sqcap D = \perp?$$

- Class membership
 - *Is individual a contained in class C?*

$$C(a)?$$

- Instance generation (Retrieval)
 - „find all x with $C(x)$ “
 - *Find all (known!) Individuals of class C.*

- **Decidability:**

for each inference problem there always exists an algorithm that terminates in finite time

- **DLs** are fragments of **FOL**, therefore (in principle) **FOL** inference algorithms (e.g. Tableaux) can be applied.

- But **FOL** algorithms do not always terminate!

- **Problem:** Find algorithms that always terminate!

- There might be no „naive“ solutions!

- **FOL** inference algorithms (Tableaux) must be adapted for **DLs**
- *(for the lecture we will restrict to $\mathcal{ALC}$ tableaux algorithm)*
- Tableaux algorithm shows **unsatisfiability** of a theory (knowledge base)
- We have to adapt the entailment problems to the **detection of contradictions in the knowledge base**, i.e. proof of the unsatisfiability of the knowledge base!

Reduction to Unsatisfiability (1)

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- Class inconsistency
 - iff $KB \cup \{C(a)\}$ unsatisfiable (a new)

$$C \equiv \perp$$

- Class inclusion (Subsumption)
 - iff $KB \cup \{(C \sqcap \neg D)(a)\}$ unsatisfiable (a new)

$$C \sqsubseteq D$$

- Class equivalency
 - iff $C \sqsubseteq D$ and $D \sqsubseteq C$

$$C \equiv D$$

Reduction to Unsatisfiability (2)

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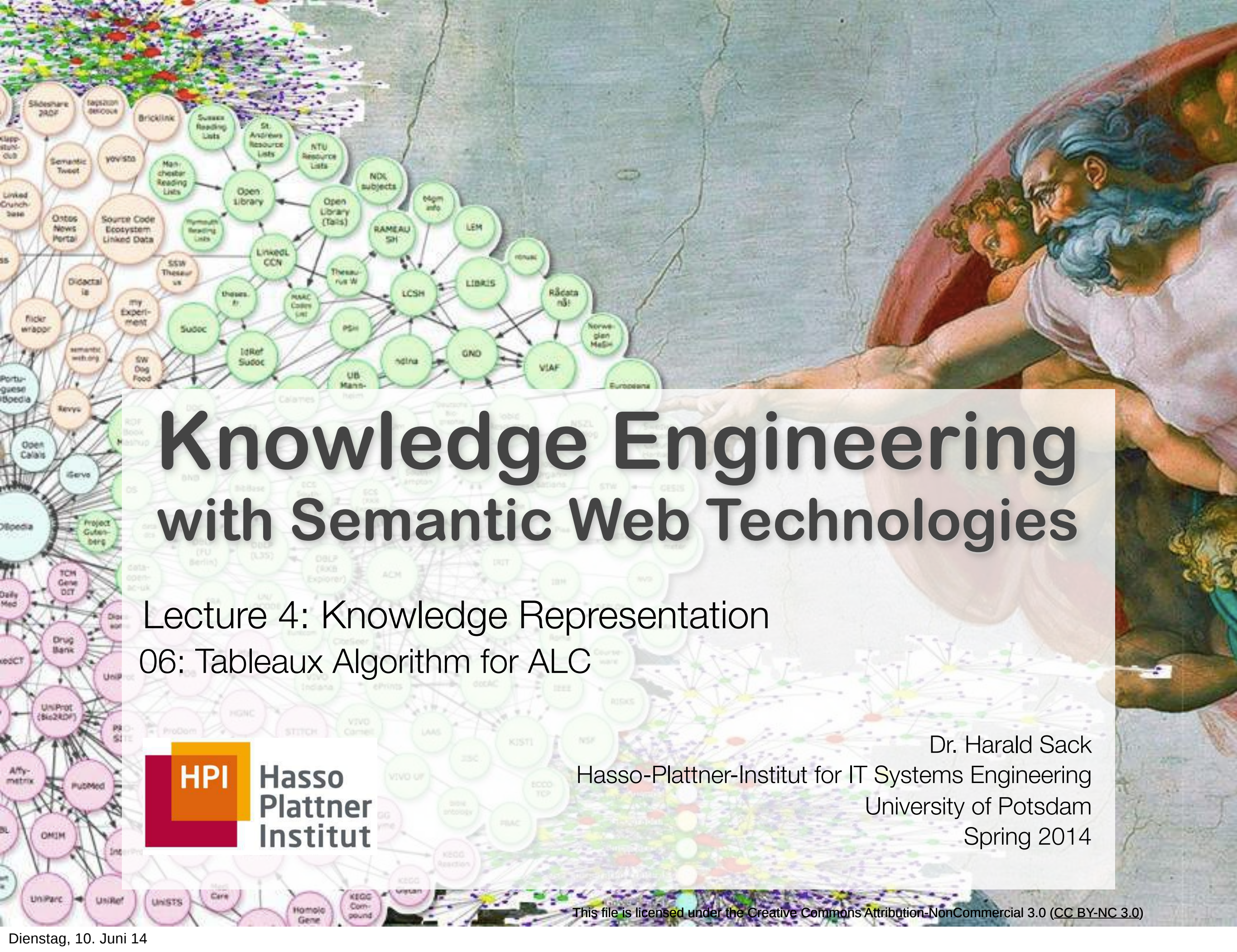
- Class disjointness $C \sqcap D = \perp$
 - iff $KB \cup \{ (C \sqcap D)(a) \}$ unsatisfiable (a new)
- Class membership $C(a)$
 - iff $KB \cup \{ \neg C(a) \}$ unsatisfiable
- Instance generation (Retrieval) „find all x with $C(x)$ “
 - ***Check class membership for all individuals***



Spiele 57 Max 31.9.22

07 Tableaux Algorithm for ALC

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06: Tableaux Algorithm for ALC



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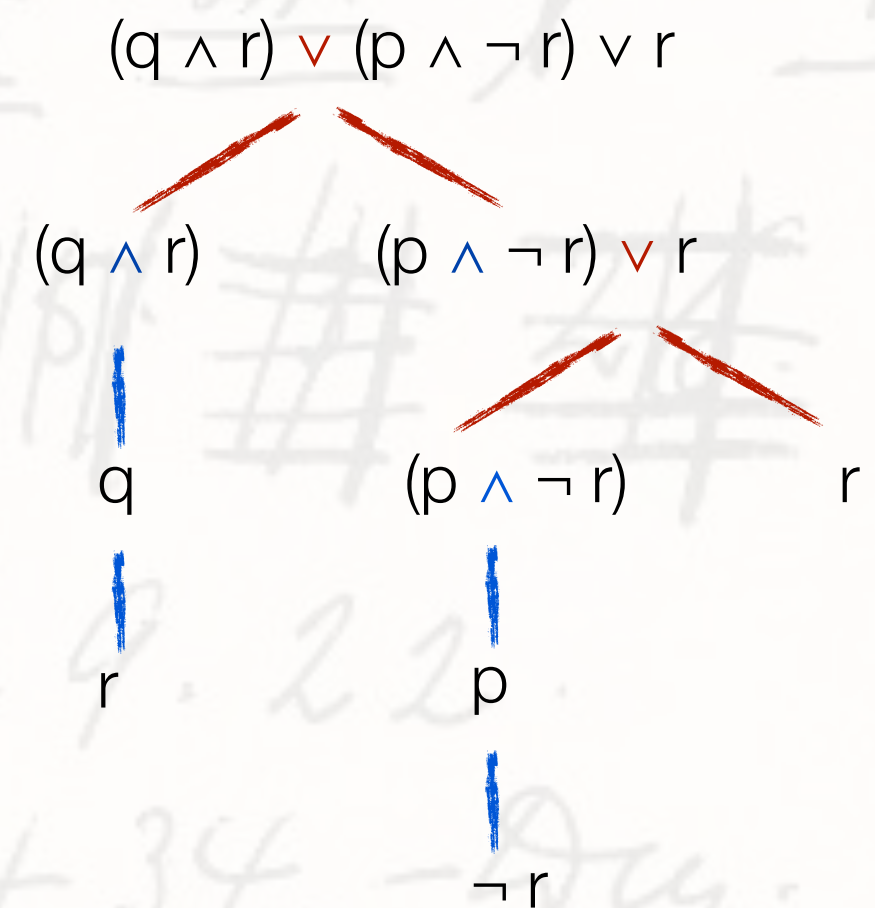
07 Tableaux Algorithm for ALC

07 Tableaux Algorithm for ALC

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Short Recapitulation

- Proof algorithm to check the consistency of a logical formula by inferring that its negation is a contradiction (**proof by refutation**).
- Construct **Tree**, where each **node** is marked with a logical formula. A **path** from the root to a leaf is the **conjunction** of all formulas represented within the nodes of the path; a **branch** of the path represents a **disjunction**.
- The tree is created by successive application of the **Tableaux Extension Rules**.



Tableaux Algorithm for Description Logics

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- Transformation to **Negation normalform NNF** necessary
 - Let W be a knowledge base,
 - Substitute $C \equiv D$ by $C \sqsubseteq D$ and $D \sqsubseteq C$
 - Substitute $C \sqsubseteq D$ by $\neg C \sqcup D$.
 - Apply the NNF Transformations from the next page
 - Resulting knowledge base $NNF(W)$
 - Negation Normalform of W .
 - Negation is placed directly in front of atomic classes.

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- NNF Transformations

$$\begin{aligned} \text{NNF}(C) &= C, \text{ if } C \text{ is atomic} \\ \text{NNF}(\neg C) &= \neg C, \text{ if } C \text{ is atomic} \\ \text{NNF}(\neg\neg C) &= \text{NNF}(C) \\ \text{NNF}(C \sqcup D) &= \text{NNF}(C) \sqcup \text{NNF}(D) \\ \text{NNF}(C \sqcap D) &= \text{NNF}(C) \sqcap \text{NNF}(D) \\ \text{NNF}(\neg(C \sqcup D)) &= \text{NNF}(\neg C) \sqcap \text{NNF}(\neg D) \\ \text{NNF}(\neg(C \sqcap D)) &= \text{NNF}(\neg C) \sqcup \text{NNF}(\neg D) \\ \text{NNF}(\forall R.C) &= \forall R. \text{NNF}(C) \\ \text{NNF}(\exists R.C) &= \exists R. \text{NNF}(C) \\ \text{NNF}(\neg\forall R.C) &= \exists R. \text{NNF}(\neg C) \\ \text{NNF}(\neg\exists R.C) &= \forall R. \text{NNF}(\neg C) \end{aligned}$$

- W and $\text{NNF}(W)$ are logically equivalent.

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- Example: $P \sqsubseteq (E \sqcap U) \sqcup \neg(\neg E \sqcup D)$

- In NNF: $\neg P \sqcup (E \sqcap U) \sqcup (E \sqcap \neg D)$

$$C \sqsubseteq D = \neg C \sqcup D$$

$$\neg(C \sqcup D) = \neg C \sqcap \neg D$$

Tableaux Extension Rules for DL

Selection	Action
$C(a) \in W$ (ABox)	Add $C(a)$
$R(a, b) \in W$ (ABox)	Add $R(a, b)$
$C \in W$ (TBox)	Add $C(a)$ for a known Individual a
$(C \sqcap D)(a) \in A$	Add $C(a)$ and $D(a)$
$(C \sqcup D)(a) \in A$	Split the path. Add (1) $C(a)$ and (2) $D(a)$
$(\exists R.C)(a) \in A$	Add $R(a, b)$ and $C(b)$ for a new Individual b
$(\forall R.C)(a) \in A$	if $R(a, b) \in A$, then add $C(b)$

- If the resulting tableaux is closed, the original knowledge base is unsatisfiable.
- Only select elements that lead to new elements within the tableaux. If this is not possible, then the algorithm terminates and the original knowledge base is satisfiable.

Tableaux Algorithm (DL) - Example

- P ... Professor
- E ... Person
- U ... University Employee
- D ... Student
- Knowledge Base: $P \sqsubseteq (E \sqcap U) \sqcup (E \sqcap \neg D)$
- We want to proof: Is $P \sqsubseteq E$ a logical consequence?
- Knowledge Base (with [negated] query) in NNF:
 $\{\neg P \sqcup (E \sqcap U) \sqcup (E \sqcap \neg D), (P \sqcap \neg E)(a)\}$

$$C \sqsubseteq D = \neg C \sqcup D$$

$$\neg(C \sqcup D) = \neg C \sqcap \neg D$$

Tableaux Algorithm (DL) - Example

- 10
- Knowledge Base $W: \{\neg P \sqcup (E \sqcap U) \sqcup (E \sqcap \neg D), (P \sqcap \neg E)(a)\}$
 - Tableaux A :

(1) $(P \sqcap \neg E)(a)$ (from knowledge base)

(2| α from 1) $P(a)$

(3| α from 1) $\neg E(a)$

(4) $(\neg P \sqcup (E \sqcap U) \sqcup (E \sqcap \neg D))(a)$ (from knowledge base)

(5| β from 4) $\neg P(a)$ | (6) $((E \sqcap U) \sqcup (E \sqcap \neg D))(a)$

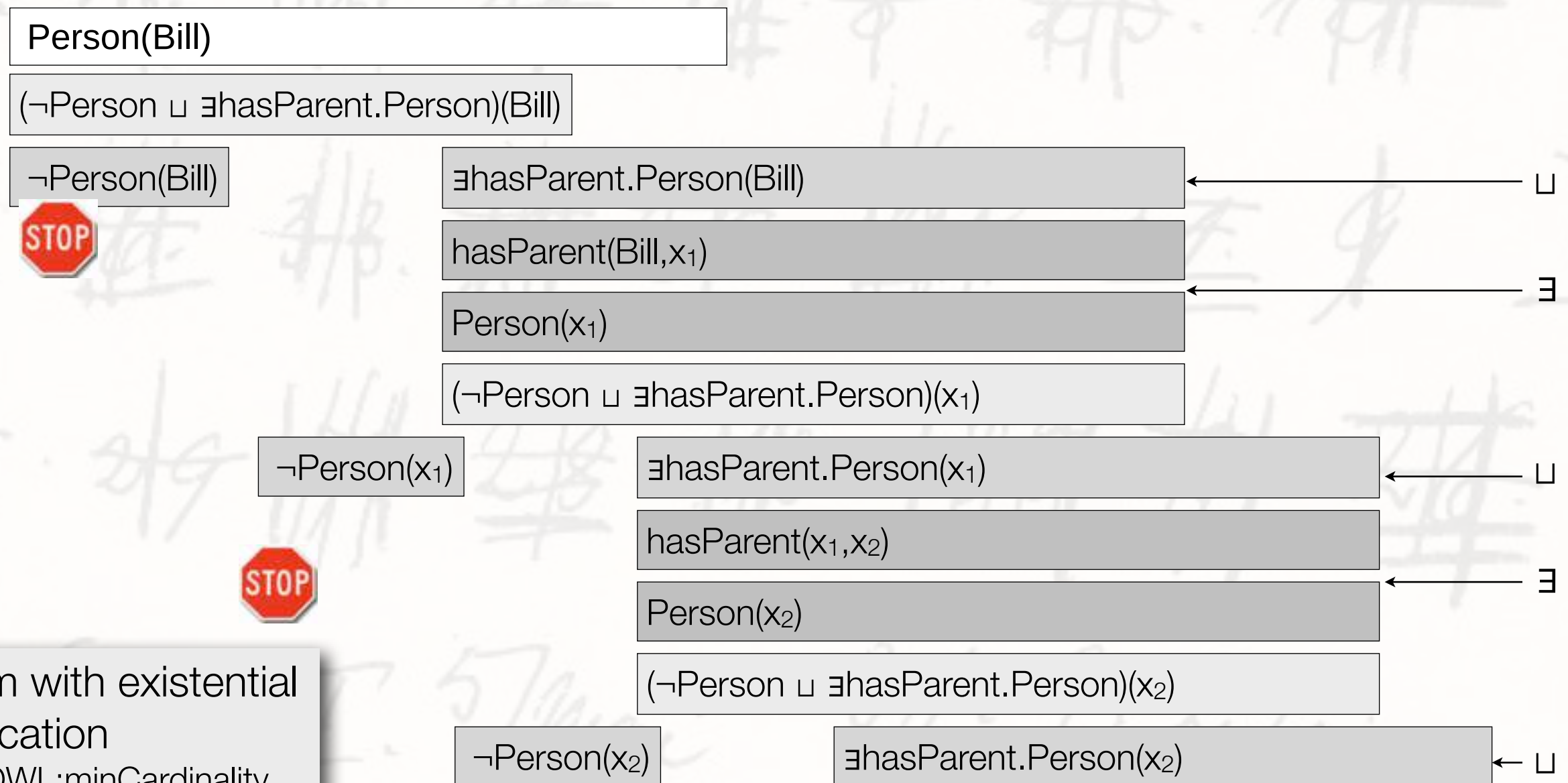
(7| β from 6) $(E \sqcap U)(a)$ | (8) $(E \sqcap \neg D)(a)$

(9| α from 7) $E(a)$ (10| α from 8) $E(a)$

(11| α from 7) $U(a)$ (12| α from 8) $\neg D(a)$

Tableaux Algorithm (DL) - Problem

- Knowledge Base: $\neg \text{Person} \sqcup \exists \text{hasParent. Person}$
- infer: $\neg \text{Person}(\text{Bill})$ $\{ \neg \text{Person} \sqcup \exists \text{hasParent. Person}, \text{Person}(\text{Bill}) \}$



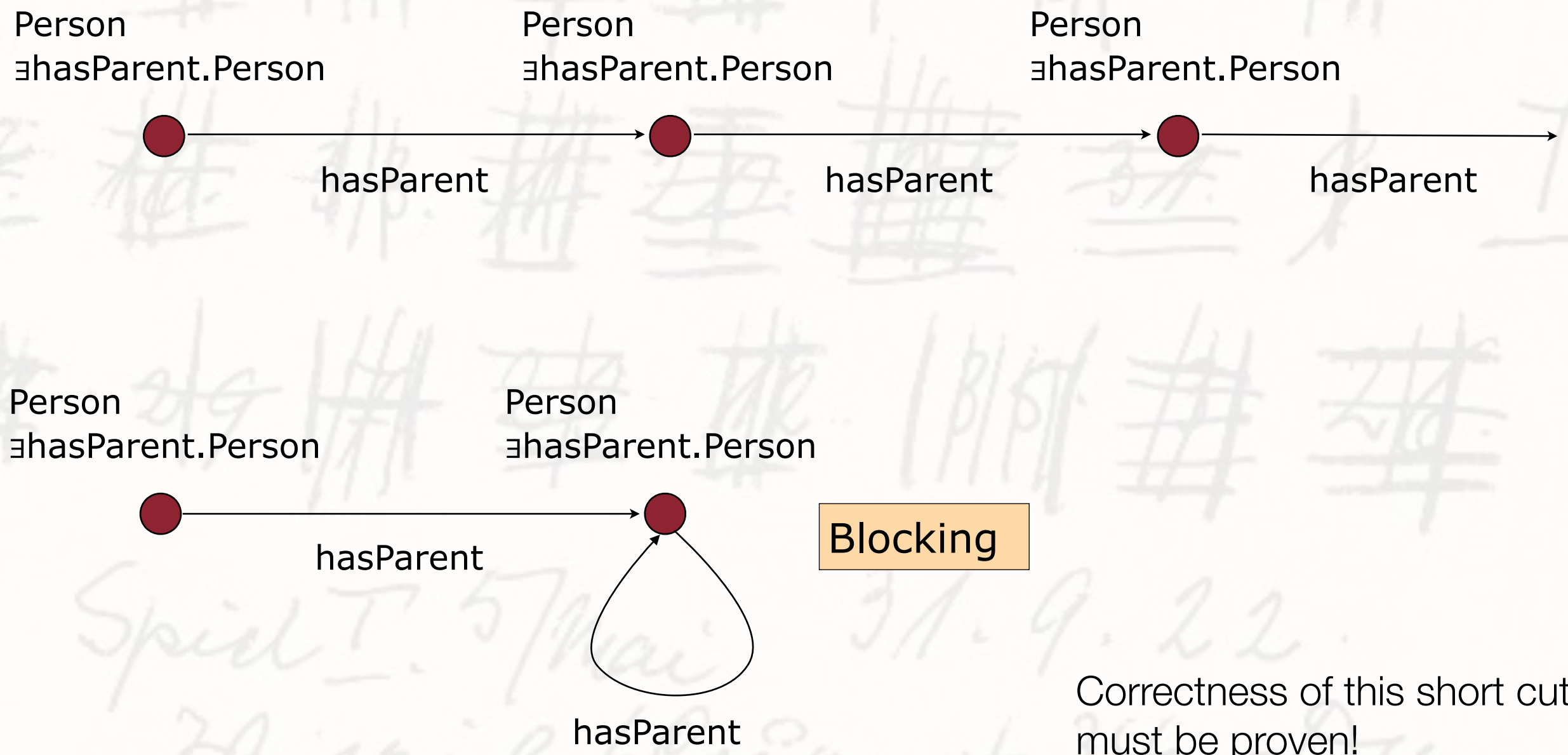
Problem with existential quantification also for OWL:minCardinality



no termination possible

Idea of Blocking

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Tableaux Algorithm (DL) with Blocking

- Knowledge Base: $\neg \text{Person} \sqcup \exists \text{hasParent. Person}$
- infer: $\neg \text{Person}(\text{Bill})$

Person(Bill)

$(\neg \text{Person} \sqcup \exists \text{hasParent. Person})(\text{Bill})$

$\neg \text{Person}(\text{Bill})$

$\exists \text{hasParent. Person}(\text{Bill})$

hasParent(Bill, x_1)

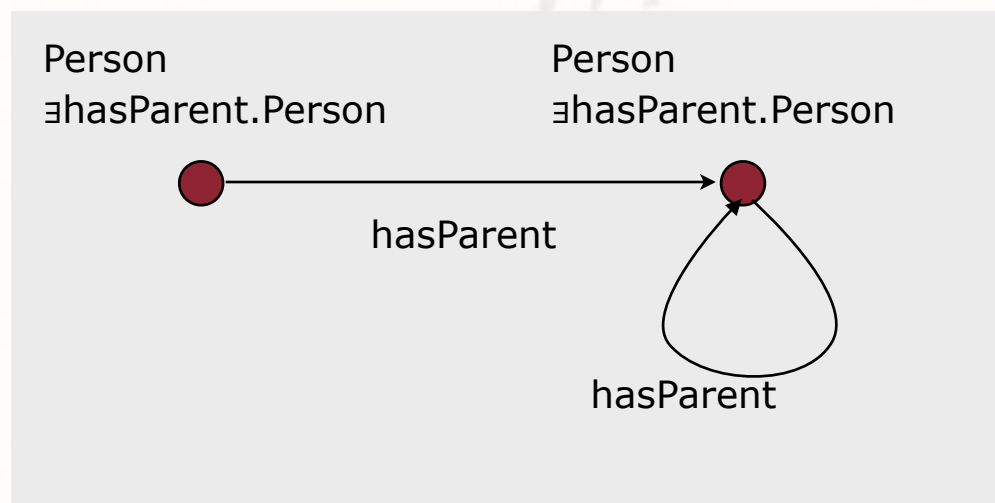
Person(x_1)

$(\neg \text{Person} \sqcup \exists \text{hasParent. Person})(x_1)$

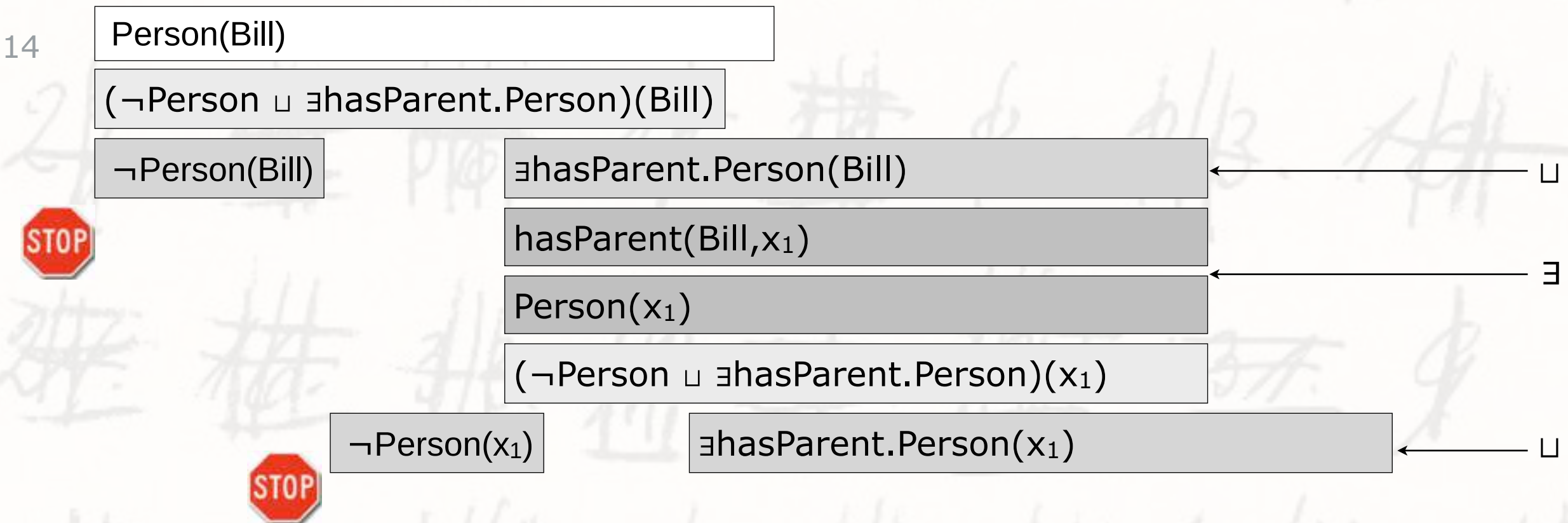
$\neg \text{Person}(x_1)$

$\exists \text{hasParent. Person}(x_1)$

termination



Tableaux Algorithm (DL) with Blocking



$\sigma(\text{Individual}) = \{\text{Classes}\}$
 σ is **Class Extension** of an Individual

$\sigma(\text{Bill}) = \{\text{Person},$
 $\neg \text{Person} \sqcup \exists \text{hasParent. Person},$
 $\exists \text{hasParent. Person}\}$

$\sigma(x_1) = \{\text{Person},$
 $\neg \text{Person} \sqcup \exists \text{hasParent. Person},$
 $\exists \text{hasParent. Person}\}$

$\sigma(x_1) \subseteq \sigma(\text{Bill})$, therefore Bill blocks x_1



termination

Tableaux Algorithm (DL) with Blocking

- ¹⁵ • The Selection of $(\exists R.C)(a)$ in the tableaux path A is **blocked**, if there is already an individual b with $\{C \mid C(a) \in A\} \subseteq \{C \mid C(b) \in A\}$.
- Two possibilities of termination:

1. Closing the Tableaux.
Knowledge Base is **unsatisfiable**.
2. All non blocked selections from the tableaux
don't lead to an extension.
Knowledge Base is **satisfiable**.



Lecture 5: Knowledge Representations II

Open HPI Course: Knowledge Engineering with Semantic Web Technologies