

NLP/MT  
Principles

EBMT Principles  
and Solution

EBMT & Rule-based  
MT

EBMT & Knowledge-  
based MT

EBMT & Stat.;  
Evaluation

U+H

# Knowledge Based Machine Translation

**Cristina Vertan**

University of Hamburg • Informatics Department  
Natural Language Systems Group

WWW: <http://nats-www.informatik.uni-hamburg.de/~cri/>

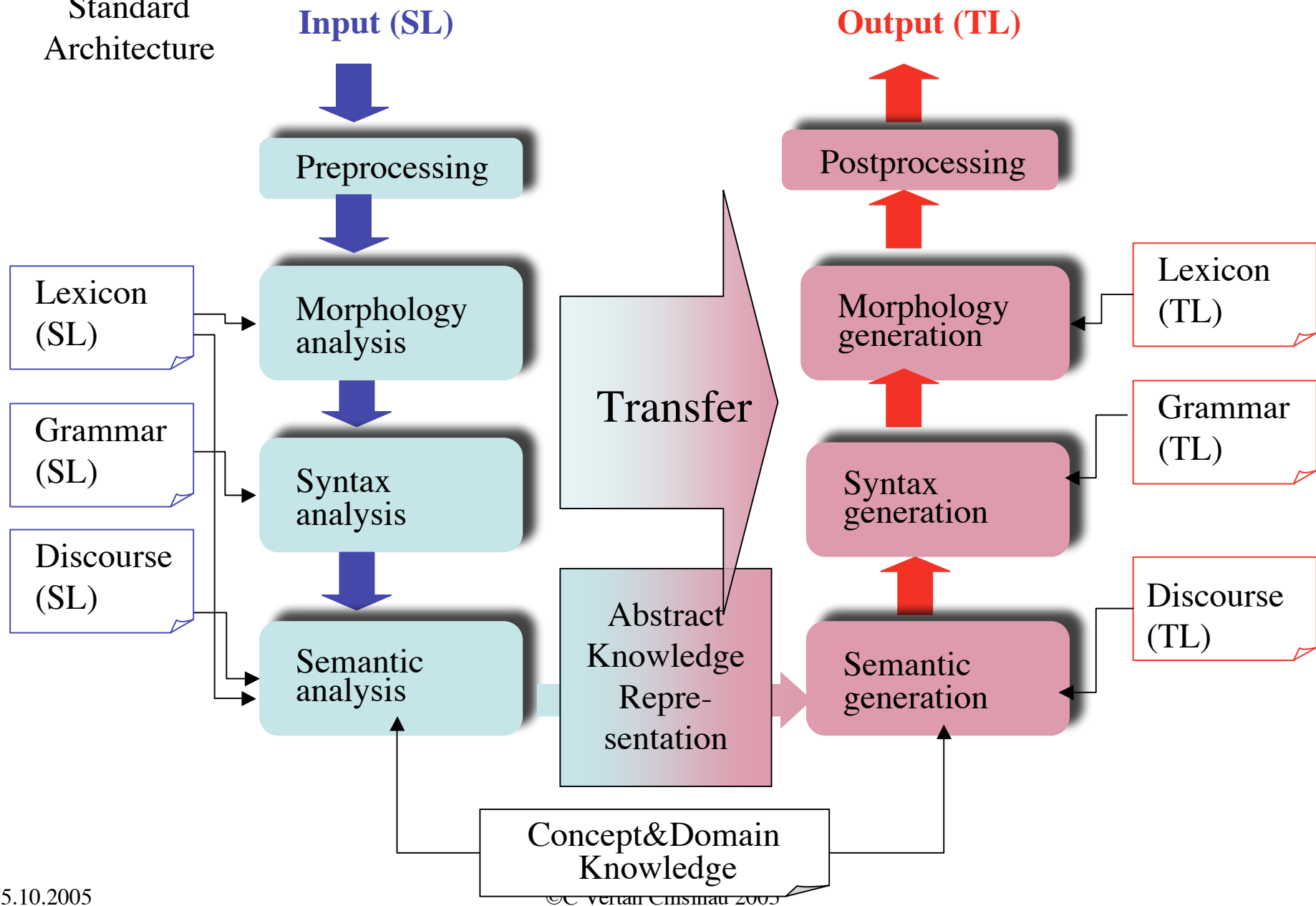
E-Mail: [vertan@informatik.uni-hamburg.de](mailto:vertan@informatik.uni-hamburg.de)

Most part of the slides from this section I owe with explicit  
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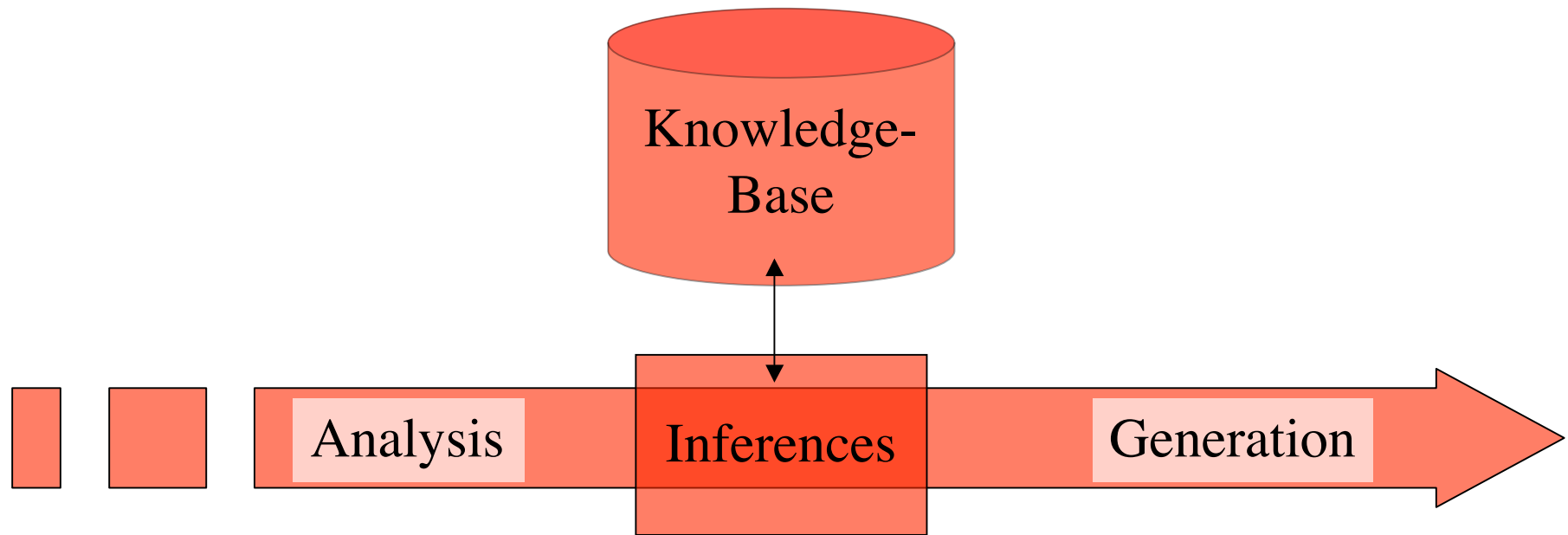
# Outline

- What is knowledge?
- Why knowledge in Machine Translation?
- Linguistic examples
- 3 Examples of systems
  - KBMT 1989
  - DBR-MAT 1999
  - Verbmobil 2001
- The Semantic Web Idea

Standard Architecture



## Derivation of Solutions from General Knowledge



Knowledge  
Based  
Processing

?Grammatical function of "dog"
"dog" sub-concept of animal, "animal" sub-concept of living
"living" = agent of "bite"
!~"dog" = grammatical subject

## Terminological Knowledge = Knowledge-based System?

- In a sense, systems that use terminological material (in a systematic order according to the domain), can be called knowledge based systems.
- However, the ontological knowledge (conceptual ordering) of the field is not declarative, but implicit in the ordering of the terminology (nomenclature). The ontology is not visible directly.

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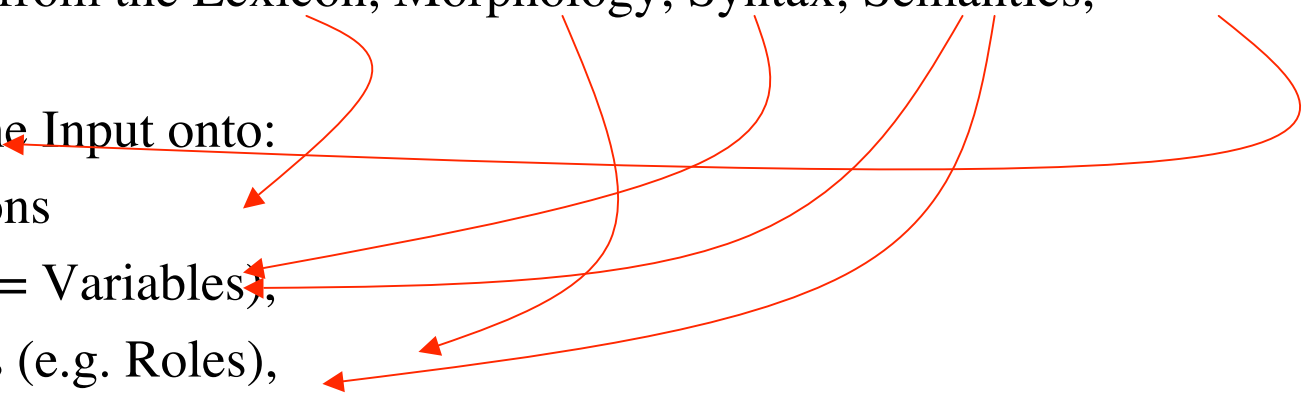
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## "Real" Knowledge in MT

# Structural Transfer with Interlingua

## Tasks:

- Content analysis from the Lexicon, Morphology, Syntax, Semantics, Pragmatics
  - = Mapping of the Input onto:
    - Presuppositions
    - Objects (e.g. = Variables),
    - Relationships (e.g. Roles),
    - Quantifiers (e.g.= Negation, Number)
  - Consistency check (e.g. Presupposition check)
  - Semantic extraction
  - Reordering of results in the generation phase
- 

## Interlingua Expression

```
[ request (referent (_5747))
  presuppose (exists (_4340)) ]
some (_4340)
[ unique (_4407)
  single (_4407)
  instance (_4407, person)
  propval (Person, _4407, sex, male)
  [ some (_4725)
    [ unique (_5033)
      single (_5033)
      instance (_5033, project)
      propval (project, _5033, name, str
              (LOKI)) ]
    instance (_4725, leading)
    propval(leading, _4725, theta, _5033)
    propval(leading, _4725, alpha, _4407)
    topic(_4407) ] ] ]
```

Interlingua systems  
construct a deep  
meaning representation  
by using additional  
knowledge of some  
sort, at least about what  
sentences are about.

Presupposition part  
of an  
Interlingua expression



# Knowledge Layers

Knowledge used in an MT system may be

- Conceptual knowledge (“ontology”, “upper model”)

---

- World knowledge (chemical laws, e.g.)

---

- Factual knowledge (situational knowledge) about the actual state of affairs

---

- Some examples:

# Conceptual Knowledge

$\forall b$  Bear (b)  $\Rightarrow$  Animal (b)    *“Bears are animals”*

$\forall b$  Bear (b)  $\Leftrightarrow$  SpeciesOf (b) = Ursidae

*“Bears belong to the species of Ursidae”*

$\forall x,y$  part of (x,y) & PhysicalThing (y)  $\Rightarrow$  PhysicalThing  
(x)    *“Parts of physical objects are physical objects”*

# World Knowledge

$\forall x \text{ PhysThing}(x) \Rightarrow \exists s \text{ size}(x) = s$

*“All physical things have a size”*

Bear (Pooh)

*“Pooh is a bear”*

T (Area (Poland, SqMiles (233000)), AD1426)

*“In 1426 Poland had the size of 239.000 square meters”*

## Situation Knowledge

In (Pooh, LivingRoom3)

“Pooh is in the living room”

Female (Speaker23)

“The current speaker is female”

(most examples from Russell/Norvig)

## Do We Need Knowledge in MT at all?

- Whatever a MT system does, it needs at least some of the before mentioned knowledge layers. If the functionality of the system is not very demanding, some parts of the conceptual knowledge can be described in the lexicon, e.g. under semantic features, sub-categorization, roles or constraints.
- But any system will run into difficulties ...

# Disambiguation

*source: situation knowledge*

“I will **go** to my office in an hour”

→ “Ich **gehe** zu meinem Büro in eine Stunde”

→ “Ich **fahre** zu meinem Büro in eine Stunde”

→ “Ich **fliege** zu meinem Büro in eine Stunde”

(engl. → germ.)

dependent on *how far away* my office is.

Similarly, in Romanian **a merge** → either **walk** or **drive**

# Anaphora antecedents

*source: concepts/facts*

“She took the ice cream from the fridge and ate **it**”

→ “Ella ha tomando la tarta del refrigerador y **la** ha  
comido” (not “**el**”)

(engl. → esp.)

# Pronouns

*source: facts*

“They go”

→ “Ei merg” / “Ele merg” / “Ei si ele merg”

(engl. → rom.)

Dependent on whether the set of persons (“they”) contains  
men or woman or both



# Lexical Specification

*source: concept hierarchy/facts*

“cousin” → “cousin” or “cousine”  
(engl. → fr.)

“Uncle“ → ”farbror” or “morbror”  
(germ. → dan.)

## 3 Examples of the use of knowledge in MT

- KBMT 1989
- DBR-MAT 1999
- Verbmobil 2001

## Example I: The **KBMT** project

Assumptions behind KBMT:

One “functionally complete” meaning representation can serve for translations to a number of languages,  
no total representation of human understanding of a text is necessary for machine translation,  
applicable to relatively unambiguous, e.g. technical documents.

# Basic Components of a KBMT System

An ontology of concepts (“domain model”, “ontology”)

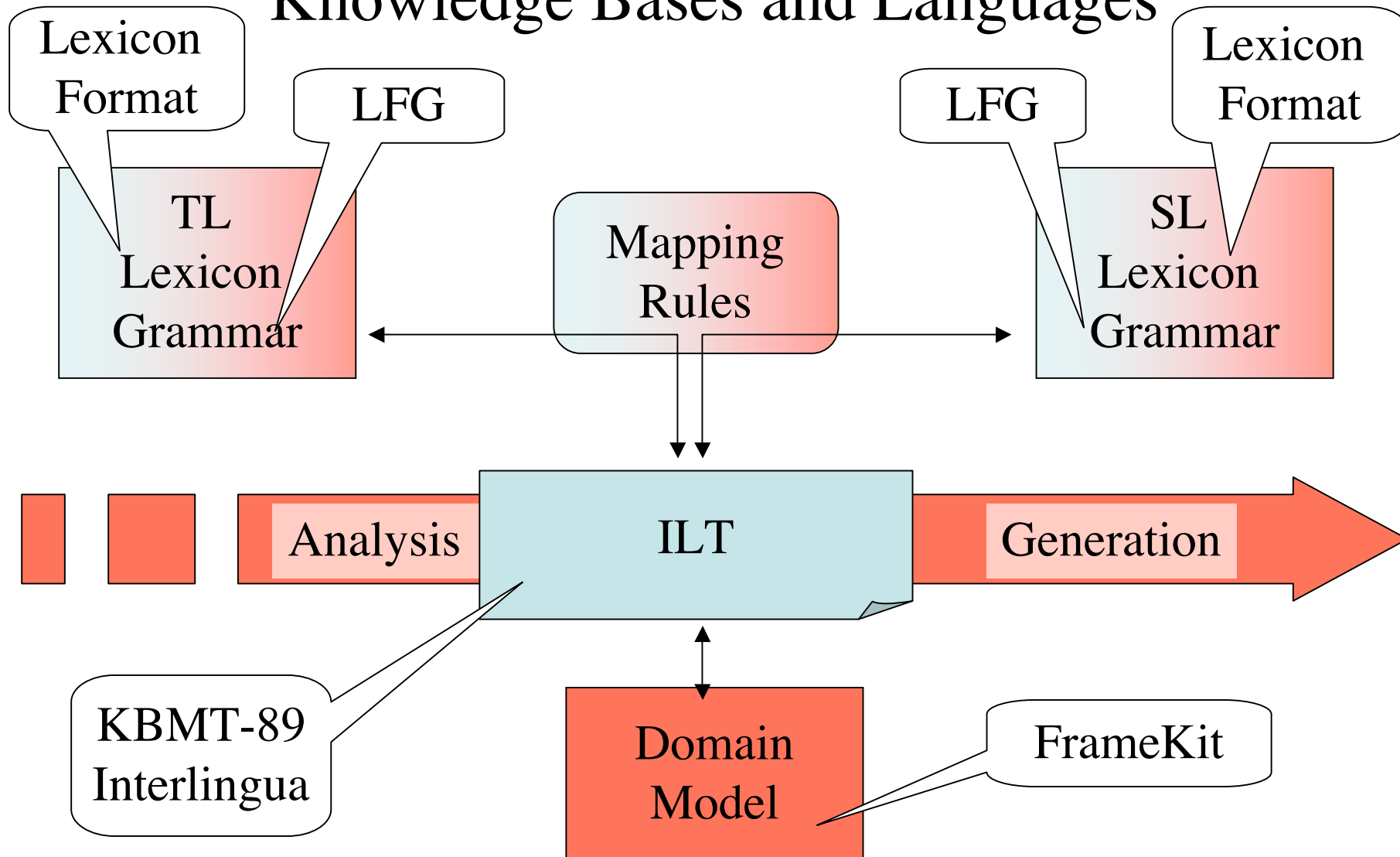
Source language (SL) lexicon and grammar for the analysis  
process

Target language (TL) lexicon and grammar for the  
generation processes

Mapping rules between the Interlingua and SL/TL syntax.

Technical aim of KBMT-89: Bidirectional translations for  
single sentences of English and Japanese in the domain of  
PC manuals.

# Knowledge Bases and Languages



# FrameKit Representation of “*Save the document*”

<i>instance_of :</i>	<i>save</i>								
<i>isa :</i>	<i>physical_event</i>								
<i>id :</i>	<i>save_43</i>								
<i>agent :</i>	<i>user</i>								
<i>patient :</i>	<table><tr><td><i>instance_of</i></td><td><i>document</i></td></tr><tr><td><i>isa</i></td><td><i>separable_entity</i></td></tr><tr><td><i>id :</i></td><td><i>document_72</i></td></tr><tr><td><i>reference :</i></td><td><i>definite</i></td></tr></table>	<i>instance_of</i>	<i>document</i>	<i>isa</i>	<i>separable_entity</i>	<i>id :</i>	<i>document_72</i>	<i>reference :</i>	<i>definite</i>
<i>instance_of</i>	<i>document</i>								
<i>isa</i>	<i>separable_entity</i>								
<i>id :</i>	<i>document_72</i>								
<i>reference :</i>	<i>definite</i>								

# KB: Frames with linguistic and non-linguistic knowledge

The KBMT-89 ontology contains

Objects

Events

Properties of objects or events

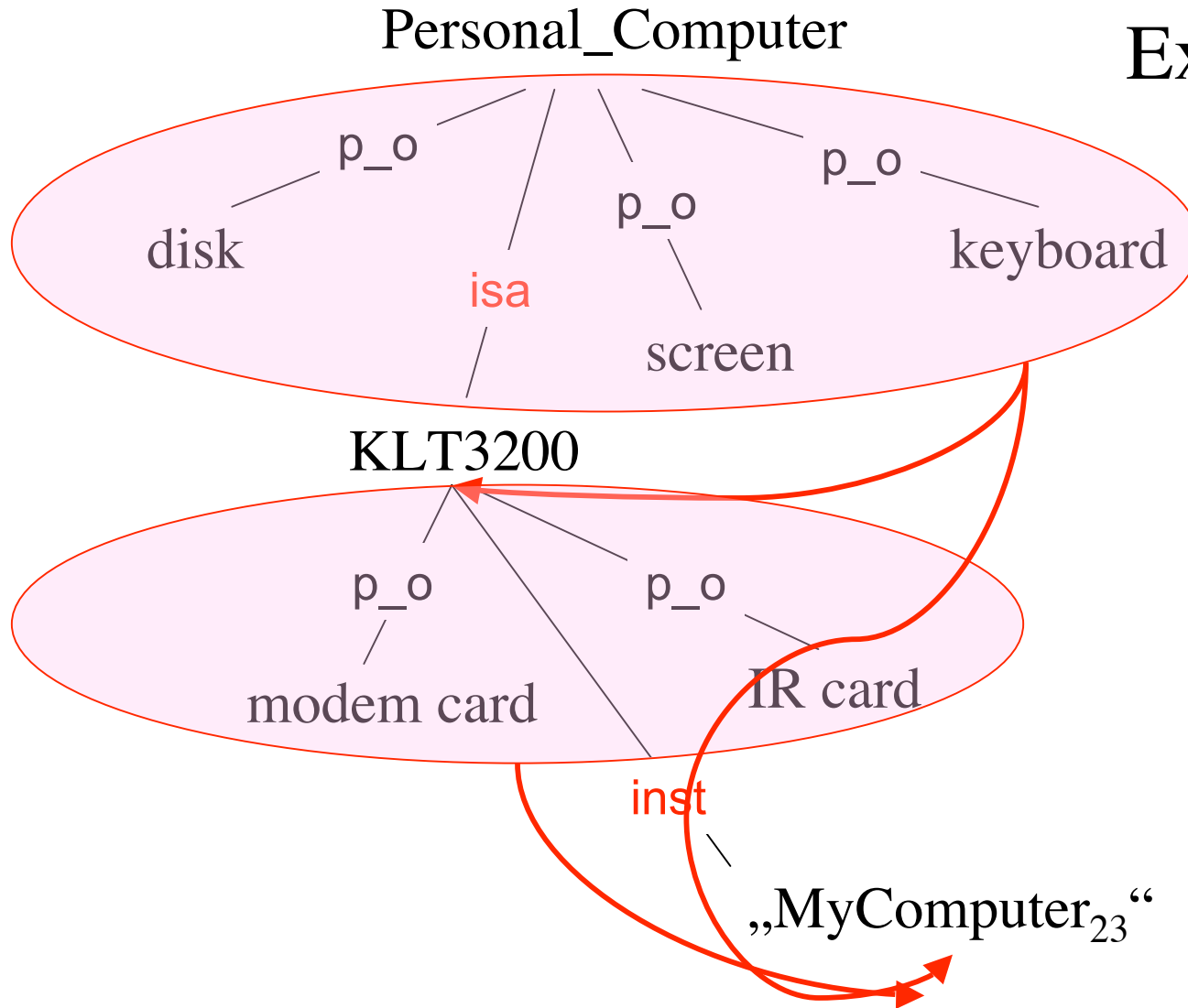
Relations

Attributes

Concepts are linked to others by relations. Each concept has attributes which specify value sets. Value sets contain only literals (i.e. no concepts).

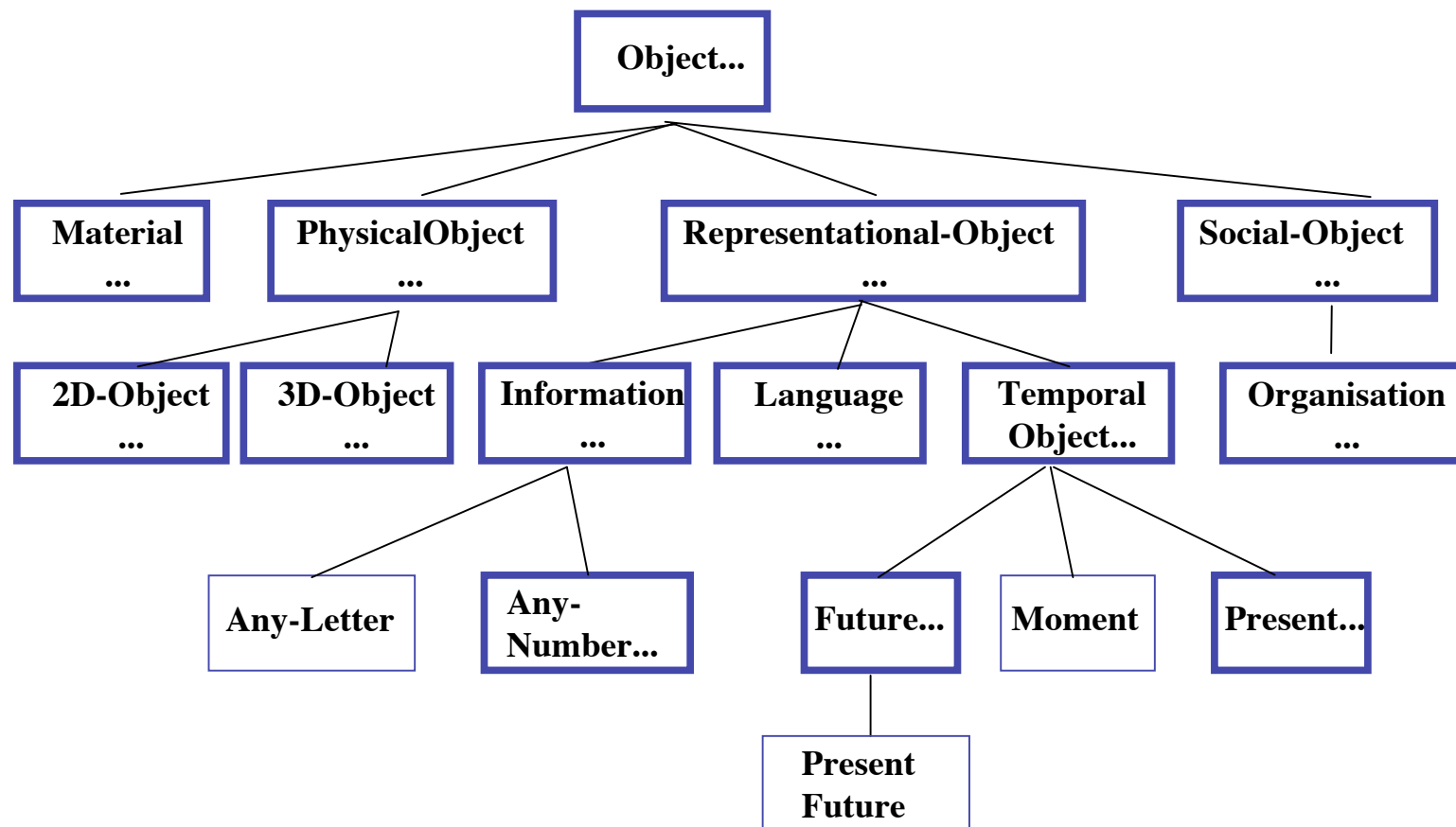
Frames support inheritance mechanisms:

# Inheritance Example





# Fragment of the ontology of KBMT-89



(Concepts in bold boxes = further sub-concepts are omitted for clarity)

*ILT for “Get the diagnostics diskette from the back  
of this manual”*

- [ \*RECEIVE
  - (AGENT \*READER)
  - (THEME [ \*DISKETTE
    - (NUMBER SINGULAR)
    - (PURPOSE [ \*DIAGNOSE
      - (NUMBER SINGULAR) ] )
      - (REFERENCE DEFINITE) ] )
      - (SOURCE [ \*BACK-OF-3D
        - (NUMBER SINGULAR)
        - (REFERENCE DEFINITE)
        - (PART-OF [ \*MANUAL
          - (NUMBER SINGULAR)
          - (REFERENCE DEFINITE)
          - (NEAR +) ] ] )
  - (TENSE PRESENT)
  - (MOOD IMPERATIVE)
  - (CLAUSAL-MARK +)
  - (NUMBER-BULLET [ \*ANY-NUMBER
    - (CARDINALITY 1) ] ] )

## Example II: The **Verbmobil** System

Transfer system for English, Japanese and German

Spontaneous speech input, on-line processing near real-time.

Sentence representation: VIT (Verbmobil Interface Term) for necessary linguistic and non-linguistic information.

no representation of semantic contents or pragmatic sense in VITs



VITs represent **dialogue acts** (--> syntactic

disambiguation, repair of gaps in speech hypotheses, and



**prosody** as indicator for structural boundaries, particle interpretation and sentence mood.

```

· Vit( vitID(sid(104,a,en,10,800,1,en,y,semantics),
    [word(he,1,[1126]),
      word(is,2,[ ]),
        word(coming,3,[1127]),
        word(at,4,[1136]),
        word(the,5,[1128]),
        word(beginning,6,[1135]),
        word(of,7,[1135]),
        word("August",8,[1134]))),
  index(1138,1125,i35),
  [beginning(1135,i37),
    arg3(1135,i37,i38),
    come(1127,i35),
    arg1(1127,i35,i36),
    decl(1137,h43),
    pron(1126,i36),
    at(1136,i35,i37),
    mofy(1134,i38,aug),
    def(1128,i37,h42,h41),
    udef(1131,i38,h45,h44)],
  [in_g(1126,1125), in_g(1137,1138),
    in_g(1127,1125), in_g(1128,1130),
    in_g(1131,1133), in_g(1134,1132),
    in_g(1135,1129), in_g(1136,1125),
    leq(1125,h41), leq(1125,h43),
    leq(1129,h42), leq(1129,h44),
    leq(1130,h43), leq(1132,h45),
    leq(1133,h43)],
  [s_sort(i35,situation),
    s_sort(i37,time),
    s_sort(i38,time),
  [dialog_act(1125,inform),
    dir(1136,no),
    prontype1136,third,std()],
  [cas(i36,nom),
    gend(i36,masc),
    num(i36,sg), num(i37,sg), num(i38,sg),
    pcase(1135,i39,of)],
  [ta_aspect(i35,progr),
    ta_mood(i35,ind),
    ta_perf(i35,nonperf),
    ta_tense(i35,pres),]
  [pros_accent(1135,progr)],

```

```

%SegmentI
%WHG string
%Index)
%Conditions
%Constraints
%Sorts
%Discourse
%Syntax
%Tense and Aspect
%Prosody

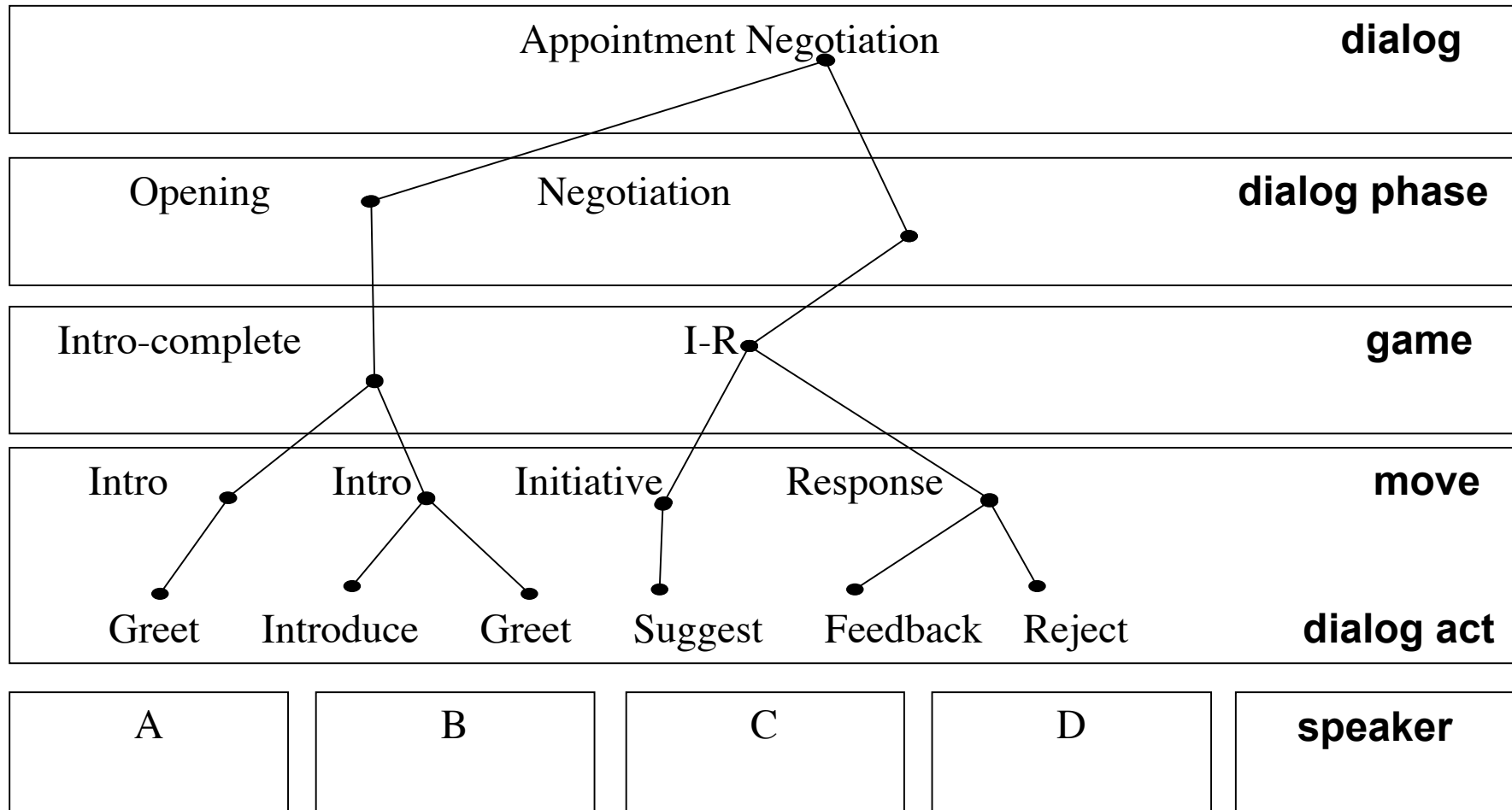
```

*“He is coming at the beginning of August”*

# Multilingual Semantic Data Base

Base form of words,  
Lexical semantic decomposition,  
Interlingual representation, if available,  
Semantic class (nominals, quantifiers, verbs, modifiers, etc.),  
Syntactic valency with mappings onto grammatical functions and thematic roles  
(linking),  
Ontological sorts, e.g.:  
    abstract  
        property, field, info-content, institution, symbol  
    space-time  
        temporal  
            situation  
                meeting\_sit, communicate\_sit, action\_sit, ...)  
        time  
    entity  
        object  
            agentive, thing  
        location  
Selectional restrictions on arguments.

# Dialog Act Structure



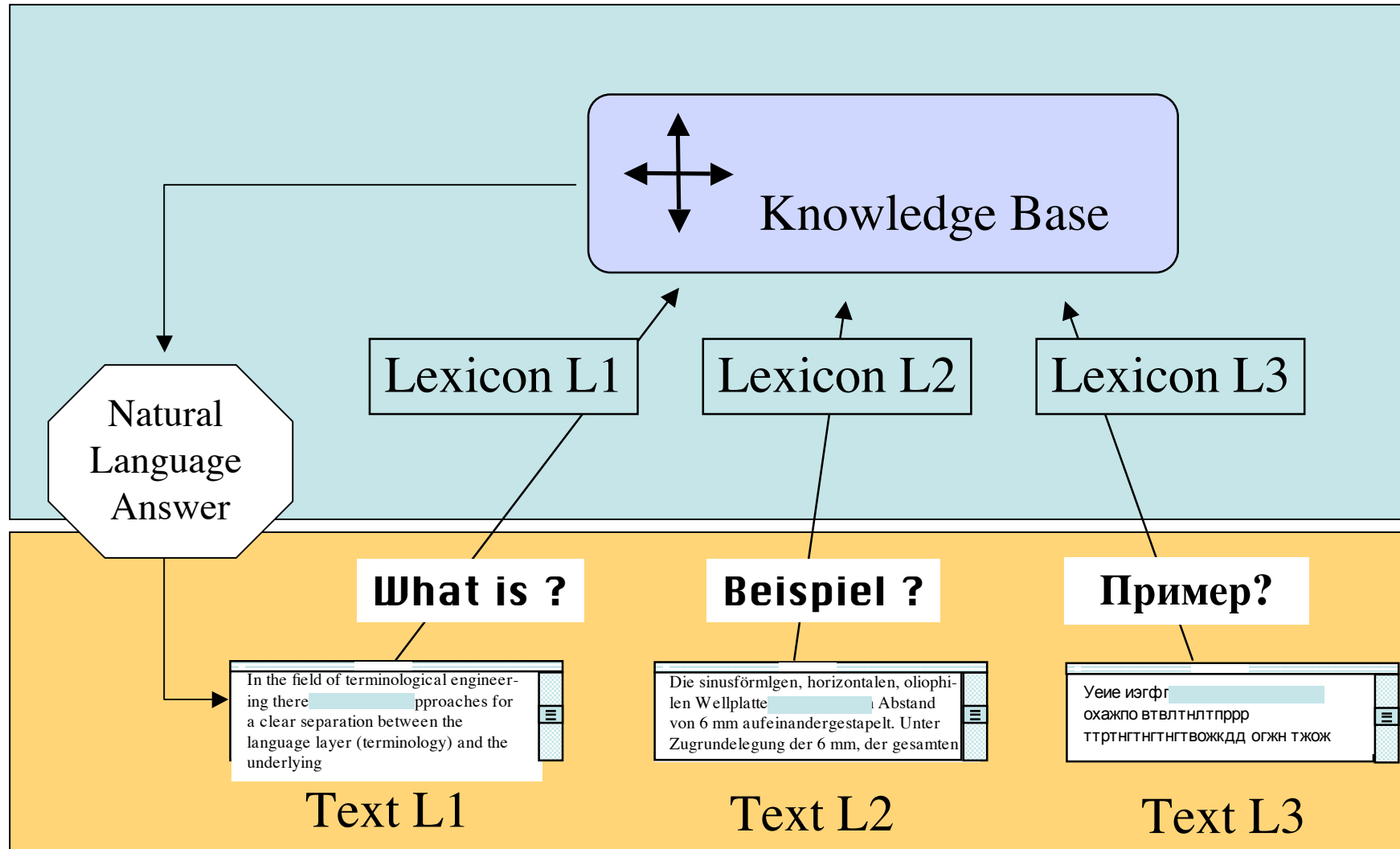
## Example III: The DBR-MAT System

Functionality:

Technical translators are supported.

- They can ask conceptual questions concerning,
  - intensional definitions,
  - extensional definitions,
  - characteristics and attributes,
  - hyponyms or meronyms
  - Examples
  - etc.
- ask for pictures,
- recursively ask about the explanations.

# The DBR-MAT Paradigm





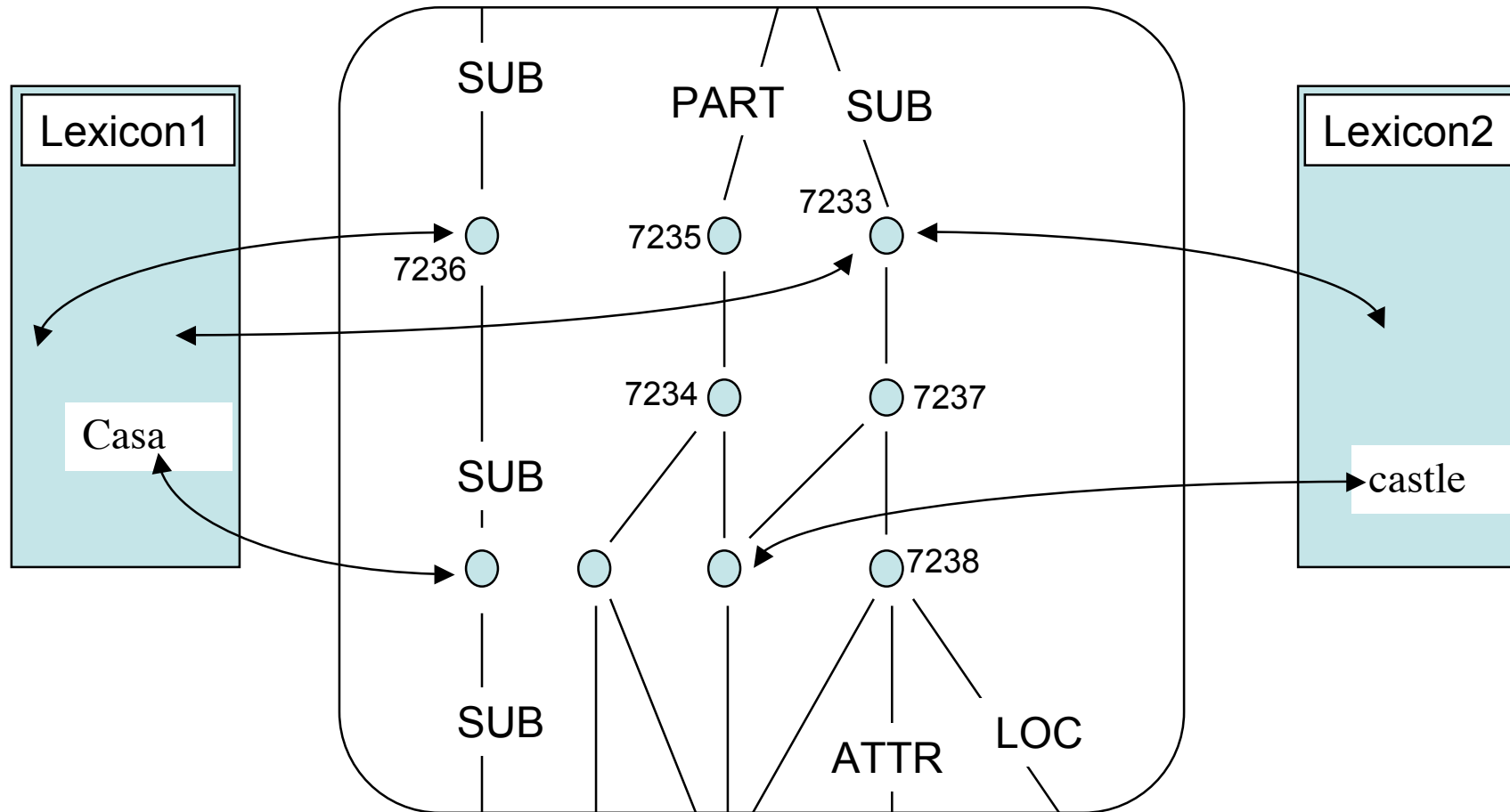
# Conceptual Graphs

Examples of complex conceptual relations (“situations”)

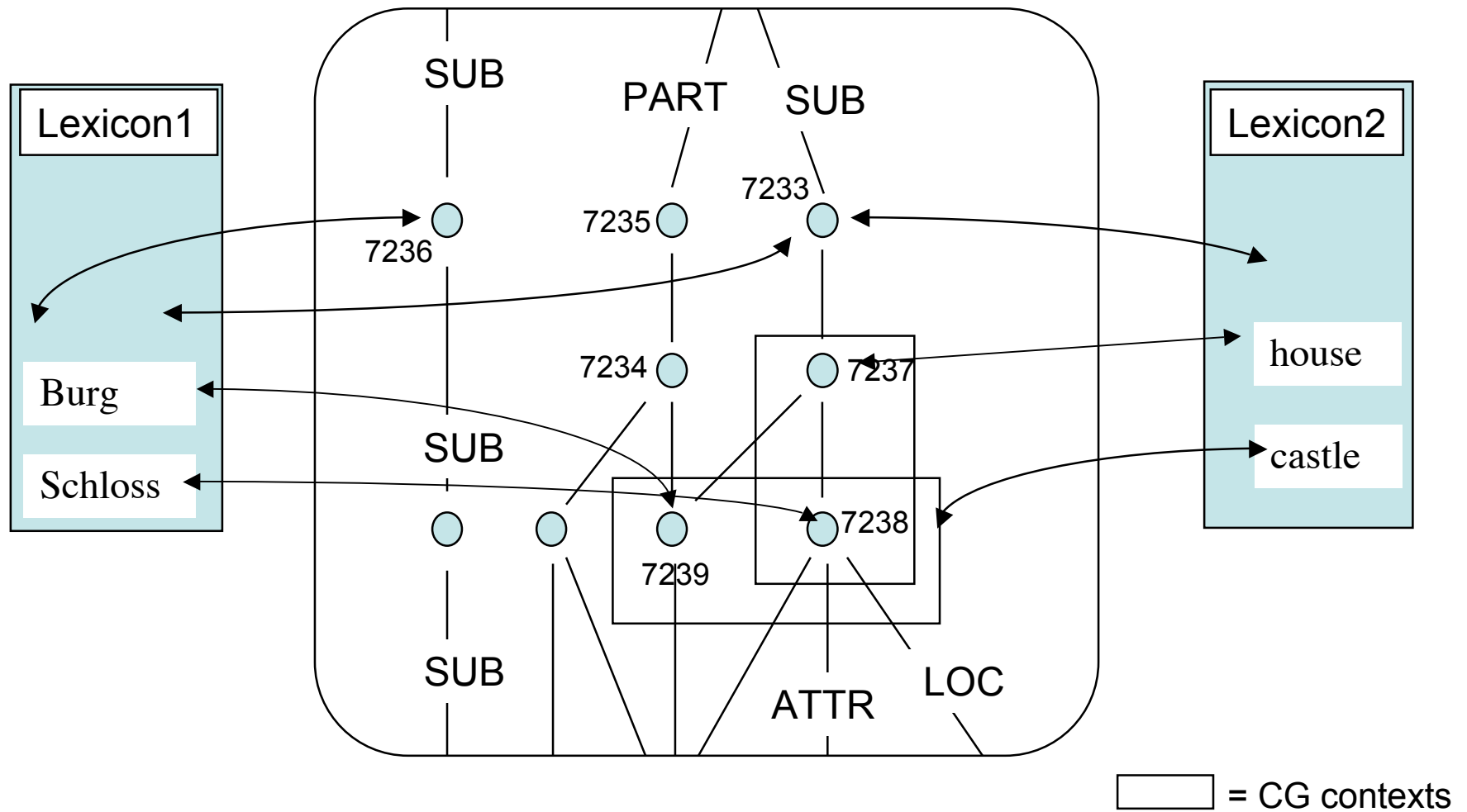
```
[SITUATION: [OIL FRAGMENT: {*}] → (IN) →
[WATER: {*}]
    → (CHAR) → [PHYSICAL STATE:
disj{MEMBRANE, DROPS, COLLOID,
EMULSION, SOLUTION}].
```

```
[SITUATION:
[WASTE WATER: {*}] → (CONTAIN) →
[OIL FRAGMENT: {*}]
→ (ATTR) → [FLOATING]
    → (ATTR) → [ROUGHLY
DISPERSED]
→ (PTNT) → [PRECIPITATION]].
```

# Connecting words and concepts



# Multiple inheritance for differences in conceptualizing



# Knowledge Base

The knowledge base of DBR-MAT contains the following objects:

KB Objects	Example
Concepts	[OIL SEPARATOR]
Individuals	the separator C334
Conceptual relations	(part_of)
Contexts (situations)	[SITUATION: [WASTE WATER: {*}] -> ...
A type hierarchy	[SEPARATOR] ↓ [OIL SEPARATOR]

# Traversing rules

<i>Submenu</i>	<i>Item</i>	<i>Evaluated Conceptual Relations</i>	<i>Inheritance</i>
What is?		Types of... - All + ATTR, Char, PART_OF	✓
Types of	All	Superconcepts + subconcepts + sister concepts	
	General	All superconcepts from the hierarchy	
	Concrete	All subconcepts from the hierarchy	
	Similar	All sister concepts from the hierarchy	
Characteristics	All	Attributes + Who + Object + How + Where	✓
	Attributes	ATTR + CHAR	✓
	Who	AGNT	
	Object	OBJ+ PTNT	
	How	INST	
	Where	LOC + DEST + FROM + IN + TO	
More...		All remaining relations	
Examples		Individual concepts	
Want All		All mentioned above, without duplicates	✓

## Critical problems of knowledge-based systems are still



1. The huge effort to build up knowledge bases,
2. A practical definition of the size (“coverage”) of the knowledge base, and
3. The choice of the representation language and its necessary logical/formal properties.

## Advantage of Knowledge Bases



- Using knowledge bases the developer definitely knows, what is represented where, although he cannot predict, what can be derived with the inference rules. With implicit and procedural (local) representations there is no method to check multiple representation.
- Declarative knowledge sources, are **global**, can be **maintained in isolation**, can be exchanged and may be used in other inference machines or grammars. It even **can be used in other systems** than translation systems.

## The Semantic Web Idea

- This basic idea of declarative and modularized knowledge has become very important since the famous paper of Berners-Lee in 2001 on the "semantic web".
- The Semantic Web (according to the definition of the W3C consortium) is
- *“the abstract representation of data on the World Wide Web, based on the RDF standards and other standards to be defined. It is being developed by the W3C, in collaboration with a large number of researchers and industrial partners.*



## The Semantic Web Idea

- *The semantic web will serve as one (or several) ontology(ies) to which all WWW objects refer and which can be used consequently for web operations like data mining, information extraction, summarization, etc”*
- **and translation!**
- The first obvious result of the semantic web activities for translation is, that widely accepted ontologies of specific domains can be used as knowledge bases for machine translation. This solves point (1) to (3) of the above mentioned list of problems.