

# Nonstandard Inferences in Description Logics

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- Short introduction to Description Logics
- Application in chemical process engineering
- Non-standard inferences least common subsumer, most specific concept, rewriting, and matching

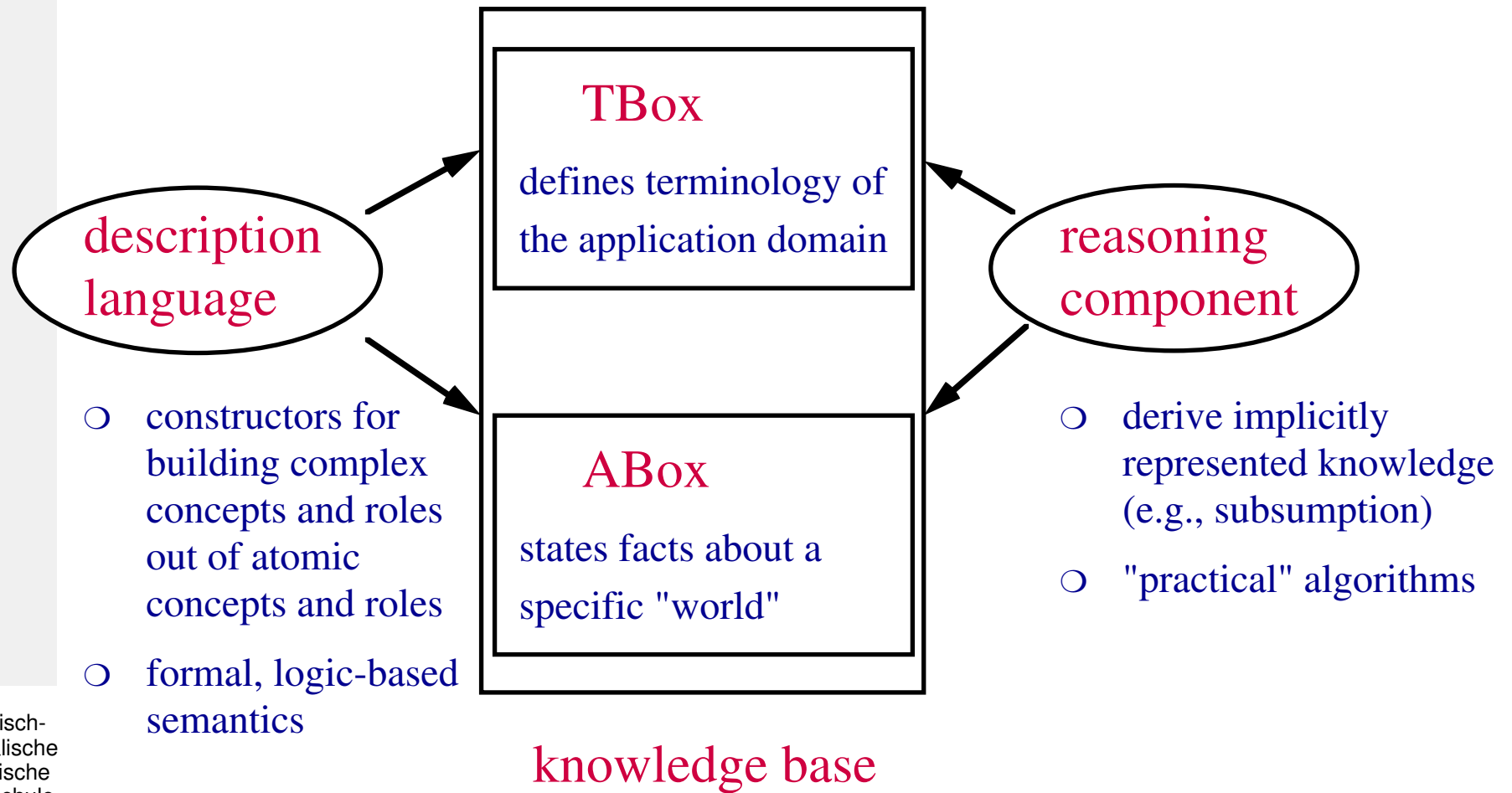
# Description logics

class of knowledge representation formalisms

- Descended from structured inheritance networks [Brachman 78].
- Tried to overcome ambiguities in semantic networks and frames that were due to their lack of a formal semantics.
- Restriction to a small set of "epistemologically adequate" operators for defining concepts (classes).
- Importance of well-defined basic inference procedures: subsumption and instance problem.
- First realization: system KL-ONE [Brachman&Schmolze 85], many successor systems (Classic, Crack, FaCT, Flex, Kris, Loom, Race...).
- First application: natural language processing; now also other domains (configuration, medical terminology, databases, chemical process engineering, ontologies for the semantic web,...)

# Description logic systems

structure



## Description language

examples of typical constructors:

$C \sqcap D, \neg C, \forall r. C, \exists r. C, (\geq n r)$

A man

that is married to a doctor, and

has at least 5 children,

all of whom are professors.

$\text{Human} \sqcap \neg \text{Female} \sqcap$

$\exists \text{ married-to} . \text{Doctor} \sqcap$

$(\geq 5 \text{ child}) \sqcap$

$\forall \text{ child} . \text{Professor}$

### TBox

definition of concepts

Happy-man =  $\text{Human} \sqcap \dots$

### ABox

properties of individuals

Happy-Man(Franz)

child(Franz,Luisa)

child(Franz,Julian)

# Formal semantics

based on interpretations as in predicate logic

An interpretation  $I$  associates

- ➔ concepts  $C$  with sets  $C^I$  and
- ➔ roles  $r$  with binary relations  $r^I$ .

The semantics of the constructors is defined through identities:

- ➔  $(C \sqcap D)^I = C^I \cap D^I$
- ➔  $(\geq n r)^I = \{d \mid \#\{e \mid (d,e) \in r^I\} \geq n\}$
- ➔  $(\forall r. C)^I = \{d \mid \forall e: (d,e) \in r^I \Rightarrow e \in C^I\}$
- ➔  $(\exists r. C)^I = \{d \mid \exists e: (d,e) \in r^I \wedge e \in C^I\}$

$$I \models A = C \text{ iff } A^I = C^I$$

$$I \models C(a) \text{ iff } a^I \in C^I$$

$$I \models r(a,b) \text{ iff } (a^I, b^I) \in r^I$$

model

## Inferences

make implicit knowledge explicit;  
are available as system services of DL systems

## Subsumption

Is  $C$  a **sub-concept** of  $D$ ?

$C \sqsubseteq D$  iff  $C^I \subseteq D^I$  for all interpretations  $I$ .

## Instance

Is  $e$  an **instance** of  $C$  w.r.t. the ABox  $\mathcal{A}$ ?

$\mathcal{A} \models C(e)$  iff  $e^I \in C^I$  for all models  $I$  of  $\mathcal{A}$ .

## Focus of DL research

- decidability/complexity of reasoning
- requires **restricted** description language
- systems and complexity results available for various combinations of constructors
- application relevant concepts must be definable
- some application domains require very **expressive** DLs
- **efficient** algorithms **in practice** for very expressive DLs?

Reasoning  
feasible

versus

Expressivity  
sufficient

# DL research

historical overview

## Phase 1

mostly **system development** (KL-ONE, LOOM, ...)

*early  
eighties*

- expressive description languages, but no disjunction, negation, exist. quant.
- use of so-called structural subsumption algorithms (polynomial)
- no formal investigation of reasoning problems and properties of algorithms

## Phase 2

**first formal investigations**

*mid-  
eighties*

- formal, logic-based semantics
- first undecidability and complexity results
- incompleteness of structural subsumption algorithms
  - ➔ incompleteness as feature (Loom, Back)
  - ➔ restrict expressive power (Classic)



### Phase 3

tableau algorithms for DLs and  
thorough complexity analysis

*end eighties to  
mid-nineties*

- Schmidt-Schauß and Smolka describe the first **complete** (tableau-based) **subsumption algorithm** for a non-trivial DL;  
*ALC*: propositionally closed (negation, disjunction, existential restrictions);  
complexity result: subsumption in *ALC* is PSPACE-complete.
- Exact **worst-case complexity** of satisfiability and subsumption for various DLs (DFKI, University of Rome I).
- Development of **tableau-based algorithms** for a great variety of DLs (DFKI, University of Rome I, RWTH Aachen, ...).
- First **DL systems with tableau algorithms**: Kris (DFKI), Crack (IRST Trento);  
first **optimization techniques** for DL systems with tableau algorithms.
- Schild notices a close connection between **DLs and modal logics**.

# $\mathcal{ALC}$ is a syntactic variant of multi-modal $\mathcal{K}$

[Schild 91]

concept name  $A$

propositional variable  $A$

role name  $r$

modal parameter  $r$

$C \sqcap D$

$t(C) \wedge t(D)$

$C \sqcup D$

translation  
 $\xrightarrow{t}$

$t(C) \vee t(D)$

$\neg C$

$\neg t(C)$

$\exists r. C$

$\langle r \rangle t(C)$

$\forall r. C$

$[r]t(C)$

interpretation  $\mathcal{I}$

Kripke structure  $\mathcal{K} = (\mathcal{W}, \mathcal{R})$

set of individuals  $\text{dom}(\mathcal{I})$

set of worlds  $\mathcal{W}$

interpretation of role names  $r^{\mathcal{I}}$

accessibility relation  $R_r$

interpretation of concept names  $A^{\mathcal{I}}$

worlds in which  $A$  is true

## Phase 4

algorithms and systems for very expressive DLs  
(e.g., without finite model property)

*late  
nineties*

- **Decidability results** for very expressive DLs by **translation into PDL** (propositional dynamic logic) (Uni Roma I), strong complexity results; motivated by database applications.
- Intensive **optimization of tableau algorithms** (Uni Manchester, IRST Trento, Bell Labs, Uni Hamburg): very efficient systems for **expressive DLs**.
- Design of **practical tableau algorithms** for **very expressive DLs** (Uni Manchester, RWTH Aachen); application to ontology reasoning for the semantic web.

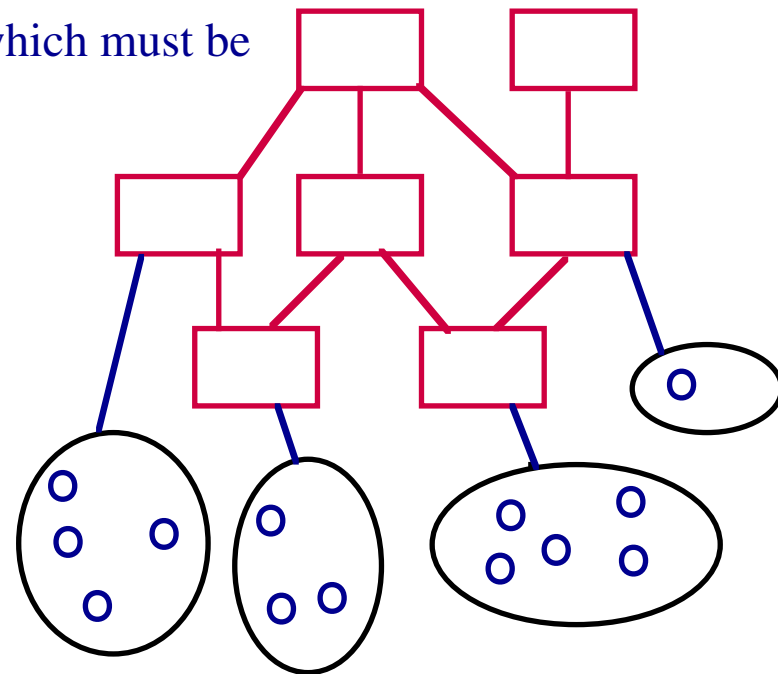
## Old and new inference problems

- **Standard inference problems** (like subsumption, instance) in Description Logics are well-investigated:
  - **Complexity results** for a great variety of DLs.
  - **Optimized implementations** for expressive DLs.
- Building and maintaining large knowledge bases requires support by additional **nonstandard inference methods**; e.g.:
  - Bottom-up construction of knowledge bases requires **least common subsumer, most specific concept, and rewriting.**
  - Search for partially specified concepts requires **matching and unification.**

# Modelling chemical processes and plants

Process Systems Engineering  
RWTH Aachen (Prof. Marquardt)

- **Computer-aided** modelling of chemical processes to analyze, simulate, and optimize the processes.
- **Modelling tool ModKit** that allows to build process models from **standard building blocks**.
- **Library of standard building blocks**, which must be extended continuously.
- Description of building blocks in a **frame-based formalism (VeDa)**.
- Structured representation of the building blocks in a **class hierarchy** supports searching and browsing.

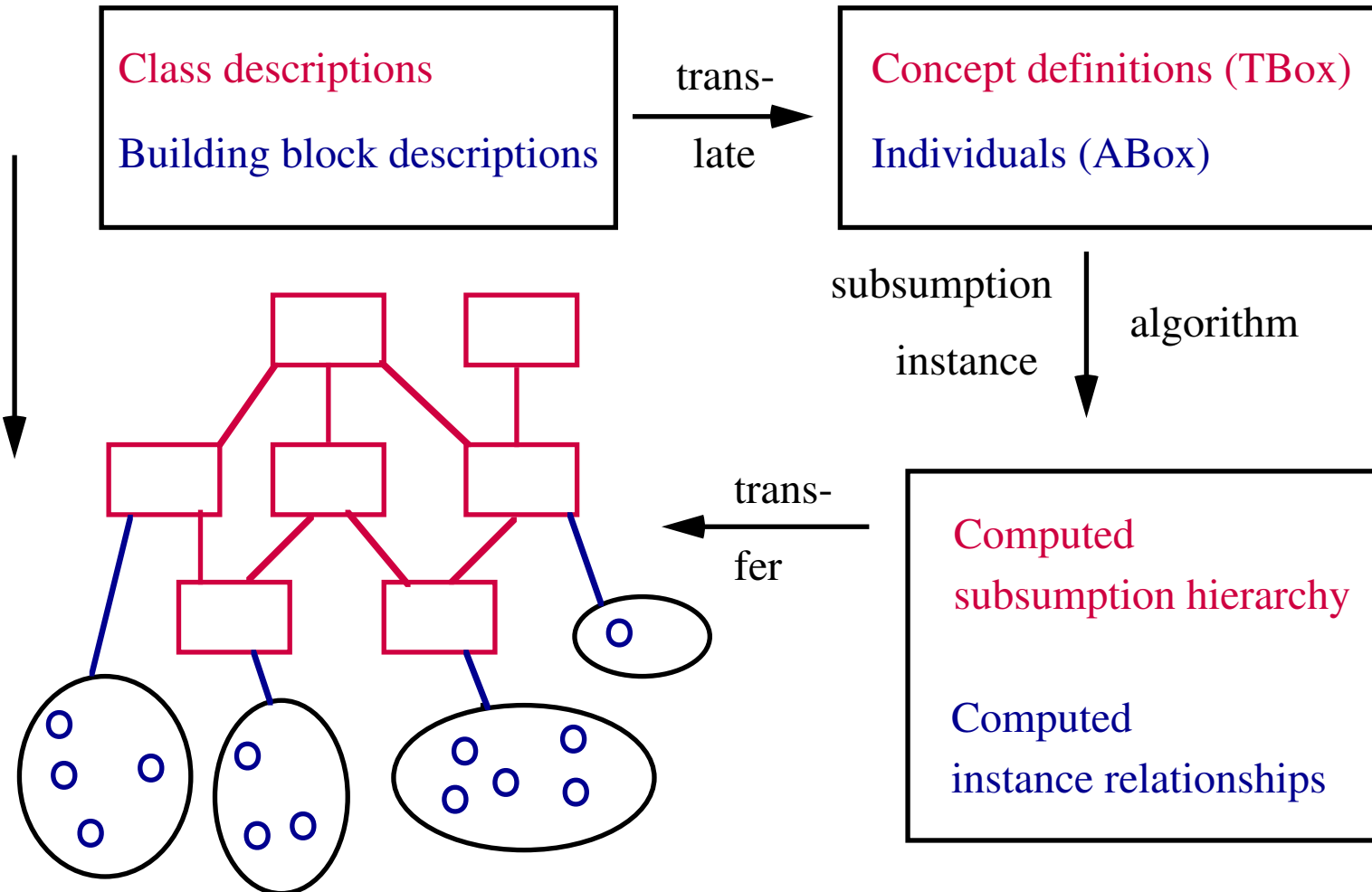


# Applying standard inferences

for the automated structuring  
of the library.

VeDa / ModKit

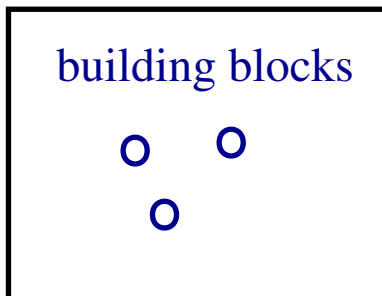
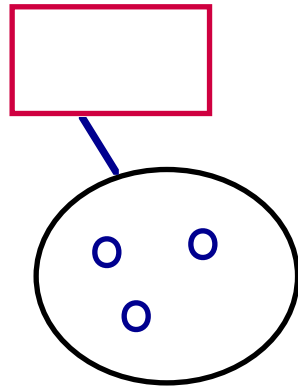
DL  $\mathcal{AL}\mathcal{E}$  / FaCT



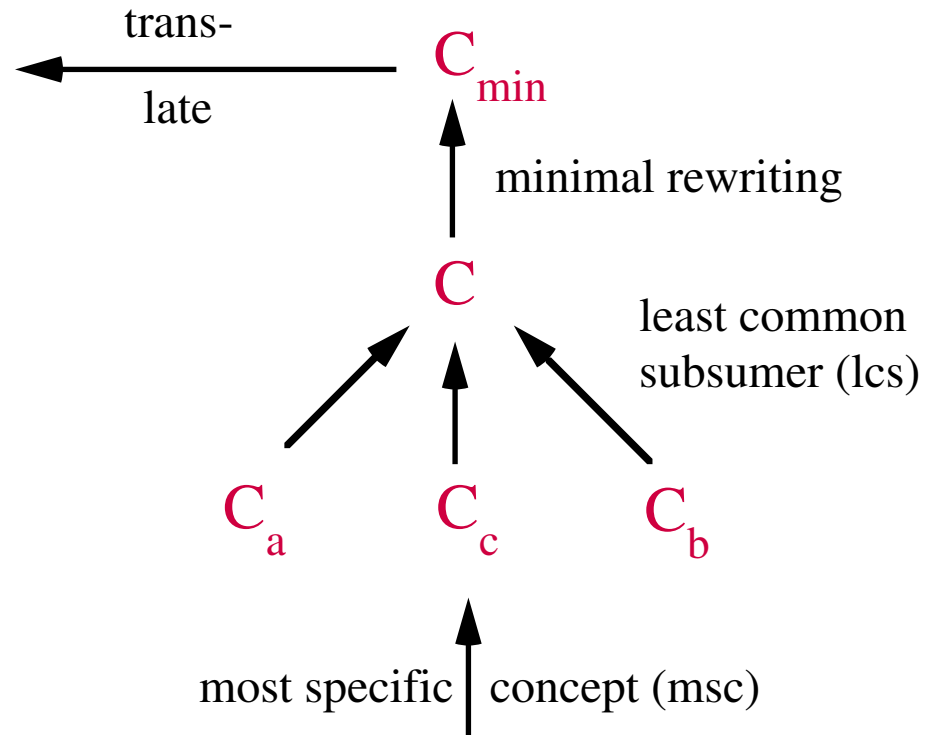
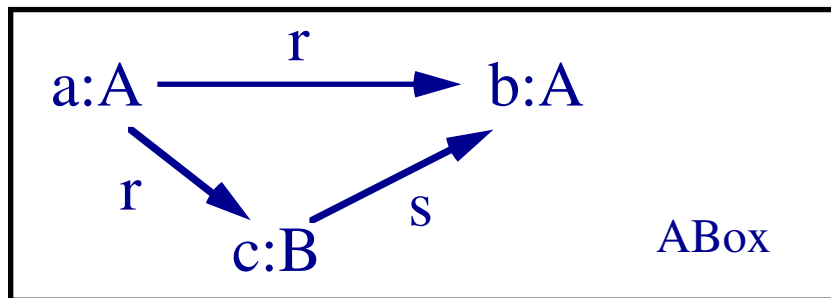
# Applying nonstandard inferences

to support the bottom-up construction of knowledge bases

new class description  
having the building blocks  
as instances



trans-  
late



## Research work

necessary to realize this approach

- **Least common subsumer:** existence and computation
  - First results for Classic (AT&T) [Cohen&Hirsh94, Frazier&Pitt96]: incorrect treatment of inconsistency and attributes.
  - First sound and complete treatment for  $\mathcal{ALN}$ ,  $\mathcal{ALE}$ , and  $\mathcal{ALEN}$  [B.&Küsters98, B.,Küsters&Molitor99, Küsters&Molitor01].
- **Most specific concept:** existence, computation or approximation
  - Existence and computation for  $\mathcal{ALN}$  with cyclic definitions [B.&Küsters98].
  - Non-existence and approximation in  $\mathcal{ALE}$  [Küsters&MolitorKI01].
- **Rewriting:** general framework, complexity and computation
  - Results for  $\mathcal{ALE}$ ,  $\mathcal{ALN}$ ,  $\mathcal{ALC}$  and sub-languages [B.,Küsters&Molitor00].
  - Related results in database research: rewriting queries using views.



# Least common subsumer

of concept descriptions

- The concept description  $E$  is the **least common subsumer** (lcs) of the concept descriptions  $C_1, \dots, C_n$  iff
  - ➔  $C_1 \sqsubseteq E, \dots, C_n \sqsubseteq E$ , and *subsumes all  $C_i$*
  - ➔  $C_1 \sqsubseteq F, \dots, C_n \sqsubseteq F$  implies  $E \sqsubseteq F$  *is the least such description*

- $\exists \text{child. Male} \sqcap \exists \text{child. Doctor}$  is in  $\mathcal{AL}\mathcal{E}$  the lcs of

$\exists \text{child. Top} \sqcap$   
 $\forall \text{child. (Male} \sqcap \text{Doctor)}$

and

$\exists \text{child. (Male} \sqcap \text{Student)} \sqcap$   
 $\exists \text{child. (Doctor} \sqcap \text{Female)}$

- In DLs with **disjunction**, lcs = disjunction and thus not interesting.
- **Questions to be answered:**  
Existence of the lcs, its size (binary, n-ary), how to compute it.

## Results

for the lcs in sublanguages of  $\mathcal{AL}\mathcal{EN}$

	$\mathcal{EL}$ $C \sqcap D, \exists r.C,$ Top	$\mathcal{ALE}$ $\mathcal{EL} + \forall r.C +$ atomic negation	$\mathcal{AL}\mathcal{EN}$ $\mathcal{ALE} +$ number restrictions
Existence	yes	yes	yes
Size (2)	polynomial	exponential	doubly exponential
Size (n)	exponential	exponential	doubly exponential
Computation	Ptime/Exptime	Exptime	2-Exptime

## Approach

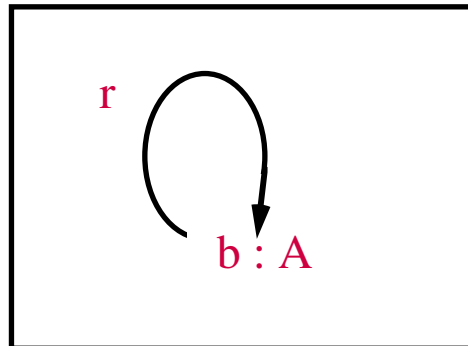
- Translate concept descriptions into **description trees**.
- Characterize subsumption via **homomorphisms**.
- Lcs as **product** of the description trees.

## Most specific concept

of an ABox individual

The concept description  $E$  is the **most specific concept** (msc) of the individual  $b$  in the ABox  $\mathcal{A}$  iff

- $\mathcal{A} \models E(b)$ , and  $b$  is an instance of  $E$
- $\mathcal{A} \models F(b)$  implies  $E \sqsubseteq F$   $E$  is the least such description



$b$  is an instance of

$A, \exists r.A, \exists r.\exists r.A, \exists r.\exists r.\exists r.A, \dots$

There is **no most specific**  $\mathcal{AL}\mathcal{E}$ -concept description  $C$  such that  $b$  is an instance of  $C$ .

## Ways out

two approaches to deal with the non-existence of the msc

- Allow for **cyclic TBoxes** with an appropriate **fixpoint semantics**:

$C = A \sqcap \exists r. C$  with gfp-semantics yields msc in the example.

For  $\mathcal{ALN}$  with cyclic definitions and gfp-semantics, the msc always **exists** and can **effectively** be **computed** [B.&Küsters98].

- Use **k-approximation of the msc**: most specific concept of **role depth at most k** having b as an instance:

$A \sqcap \exists r. (A \sqcap \exists r. A)$  is the **2-approximation** of the msc in the example.

For  $\mathcal{ALE}$ , the k-approximation always **exists** and can **effectively** be **computed**. More efficient approaches for sub-languages of  $\mathcal{ALE}$  [Küsters&MolitorKI01].

# Rewriting in DL

our motivation

Non-standard inference procedures for DLs, like

- computing the least common subsumer (lcs),
- matching and unification of concept descriptions,

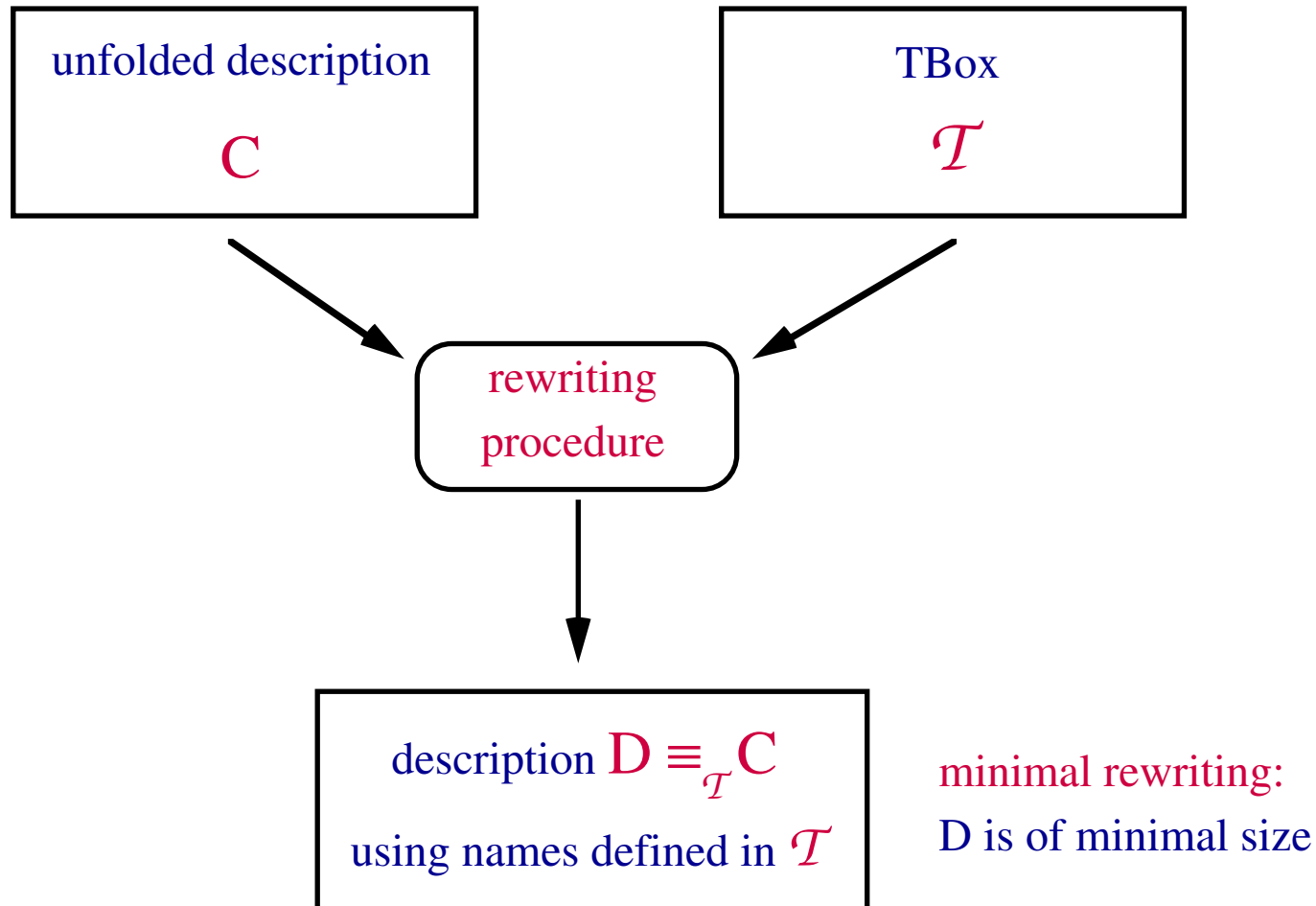
produce concept descriptions that

- are shown to the user for inspection,
- may be quite large,
- are unfolded, i.e., do not use concept names defined in the TBox.

Inference service that automatically  
increases readability of concept descriptions?

# Rewriting

concepts using a TBox



## Example

$\text{Happy} \sqcap$   
 $\forall \text{child} . \forall \text{child} . (\text{Rich} \sqcap \text{Happy})$

$A = \text{Happy} \sqcap \forall \text{child} . \forall \text{child} . \text{Rich}$

$B = \forall \text{child} . \text{Happy}$

$C = \forall \text{child} . (B \sqcap \forall \text{child} . \text{Rich})$

rewriting  
procedure

$A \sqcap \forall \text{child} . B$

$\text{Happy} \sqcap C$

*minimal*

## Results

for the minimal rewriting problem in DLs  
[B., Küsters & Molitor 00]

- Complexity of the corresponding optimization problem:
  - ➔ *ALN*: NP-hard, in  $\Sigma_2^P$
  - ➔ *ALE*: NP-hard, in PSPACE
  - ➔ *ALC*: PSPACE-complete
- Nondeterministic algorithms computing all minimal rewritings in *ALE* and *ALN*.
- Heuristic rewriting algorithm for *ALE* behaves quite well in practice: descriptions of size 800 obtained as lcs in the process engineering application are rewritten into descriptions of size 10.



# Matching in DL

our motivation

- **Design by modification:**  
before defining a new building block from scratch, the process engineers try to locate a structurally similar one in the knowledge base, and then modify the existing block.
- **Matching** allows to look for concepts having a certain (partially specified) structure:

Assume we look for concepts concerned with individuals having a son and a daughter sharing some characteristic:

$$\exists \text{child. (Male} \sqcap X) \sqcap \exists \text{child. (Female} \sqcap X) \quad \textit{variable}$$

is a **concept pattern** expressing this.

The substitution  $\{X \longrightarrow \text{Tall}, Y \longrightarrow \text{Tall}\}$  shows that this pattern matches the description

$$\exists \text{child. (Male} \sqcap \text{Tall}) \sqcap \exists \text{child. (Female} \sqcap \text{Tall})$$

# Matching in DL

## definition and results

Let  $C$  be a concept and  $D$  be a pattern.

The substitution  $\sigma$  is a **matcher** of  $C \equiv^? D$  iff  $C \equiv \sigma(D)$ .

- Matching in  $\mathcal{ALN}$  [B., Küsters, Borgida, McGuinness 99]:
  - ➔ **Existence** of matchers can be decided in **polynomial time**.
  - ➔ Solvable problems have a unique **least matcher**, which can be **computed in polynomial time**.
  - ➔ Matching problems are translated into **formal language equations**.
- Matching in  $\mathcal{ALE}$  [B.&Küsters00]:
  - ➔ **Existence** of matchers is an **NP-complete** problem.
  - ➔ Solvable problems have finitely many **minimal matchers**, which can be **computed in exponential time**. Both the number and the size of matchers may be exponential.
  - ➔ Approach depends on **partial homomorphisms** and **lcs**.

## Conclusion

- Compared to the body of results for standard inferences, the research on nonstandard inferences is just at the beginning.
- For lcs, msc, and matching, we have a relatively clear picture for (sub-languages of)  $\mathcal{AL}\mathcal{E}$  and  $\mathcal{AL}\mathcal{N}$ .
- Other interesting nonstandard inferences:
  - Unification, i.e., patterns on both sides of the equation: considerably harder than matching;  
Exptime-complete for  $\mathcal{FL}_0$  ( $C \sqcap D, \forall r. C$ ).
  - Approximation of concepts in one DL by concepts in another DL: we just started to work on this.