

# Progress in Higher-Order Automated Ontology Reasoning

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PAAR 2010, Edinburgh, UK, July 14, 2010

Research funded by  
DFG grant BE 2501/6-1





Ontology Reasoning  
— SUMO and Sigma —

- ▶ SUMO — Suggested Upper Merged Ontology  
(NilesPease, FOIS, 2001)
  - ▶ open source, formal ontology: [www.ontologyportal.org](http://www.ontologyportal.org)
  - ▶ has been extended for a number of domain specific ontologies
  - ▶ altogether approx. 20,000 terms and 70,000 axioms
  - ▶ employs the SUO-KIF representation language, a simplification of Genesereth's original Knowledge Interchange Format (KIF)
- ▶ Sigma (Pease, CEUR-71, 2003)
  - ▶ browsing and inference system for ontology development
  - ▶ integrates KIF-Vampire and SystemOnTPTP

SUMO (and similarly Cyc) contains **higher-order representations**, but there is only very limited automation support so far

⇒ better automation support is goal of DFG project

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- ▶ Embedded formulas

*term* ::= *variable*|*word*|*string*|*funterm*|*number*|*sentence*

(holdsDuring (YearFn 2009) (likes Mary Bill))

- ▶ ...often in combination with modal operators such as holdsDuring, knows, believes, etc.
- ▶ Predicate variables, function variables, propositional variables
- ▶ Lambda-Abstraction with KappaFN

# Higher-Order Aspects in SUO-KIF and SUMO: Examples

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- ▶ Predicate variables, function variables, propositional variables

`funterm ::= (funword arg+)`    `relsent ::= (relword arg+)`

`funword, relword ::= initialchar wordchar* | variable`

- ▶ Lambda-Abstraction with `KappaFN`

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# Current FO translation 'tricks'

First-order reasoning on a large ontology

(PeaseSutcliffe, CEUR 257, 2007)

- ▶ Quoting of embedded formulas

**A:** (holdsDuring (YearFn 2009) (likes Mary Bill))

**Q:** (holdsDuring (YearFn ?Y) (likes ?X Bill))

Current project focus:

embedded formulas and modal operators

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Answer with FO-ATPs (?Y ← 2009, ?X ← Mary)

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## First-order reasoning on a large ontology

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- ▶ Quoting of embedded formulas

**A:** (holdsDuring (YearFn 2009)  
    '(and (likes Mary Bill) (likes Sue Bill)))

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Failure with FO-ATP

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Why not trying higher-order automated theorem proving directly?

Current project focus:

embedded formulas and modal operators



## The SUO-KIF to TPTP THF0 Translation

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- ▶ THF0: new TPTP format for simple type theory  
(SutcliffeBenzmüller, J.Formalized Reasoning, 2010)
- ▶ THF0 ATPs: LEO-II, TPS, IsabelleP, Satallax  
THF0 (counter-)model finders: IsabelleM, IsabelleN, Satallax
- ▶ achieved:

SUO-KIF  $\longrightarrow$  TPTP THF0

translation mechanism for SUMO as part of Sigma

- ▶ so far only exploits base type  $\iota$  and  $o$  in THF0 ( $\rightarrow$  improvable)
- ▶ generally applicable to SUO-KIF representations
- ▶ translation example (for SUMO) available at:

<http://www.ags.uni-sb.de/~chris/papers/SUMO.thf>

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Main challenge: find consistent typing for untyped SUO-KIF

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(instance instance BinaryPredicate)
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→ ...and so on ...

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→ ...and so on ...



## Higher-Order Automated Theorem Proving in Ontology Reasoning

## Example (1: Embedded Formulas)

During 2009 Mary liked Bill and Sue liked Bill. Who liked Bill in 2009?

**A:** (holdsDuring (YearFn 2009)  
    (and (likes Mary Bill) (likes Sue Bill)))

**Q:** (holdsDuring (YearFn 2009) (likes ?X Bill))

Proof by LEO-II(+E) in 0.19s

## Example (2: Embedded Formulas (1 modified))

During 2009 Mary liked Bill and Sue liked Bill. Who liked Bill in 2009?

**A:** (holdsDuring (YearFn 2009)  
 (not (or (not (likes Mary Bill))  
 (not (likes Sue Bill)))))

**Q:** (holdsDuring (YearFn 2009) (likes ?X Bill))

Proof by LEO-II(+E) in 0.19s

## Example (3: Embedded Formulas)

At all times Mary likes Bill. During 2009 Sue liked whomever Mary liked. Is there a year in which Sue has liked somebody?

**A:** (holdsDuring ?Y (likes Mary Bill))

**B:** (holdsDuring (YearFn 2009)  
    (forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))

**Q:** (holdsDuring (YearFn ?Y) (likes Sue ?X))

Proof by LEO-II(+E) in 0.13s

## Example (4/5: Embedded Formulas (3 modified))

What holds that holds at all times. Mary likes Bill. During 2009 Sue liked whoever Mary liked. Is there a year in which Sue has liked somebody?

**A:** ( $\Rightarrow$  ?P (holdsDuring ?Y ?P))

**B:** (likes Mary Bill)

**C:** (holdsDuring (YearFn 2009)  
(forall (?X) ( $\Rightarrow$  (likes Mary ?X) (likes Sue ?X))))

**Q:** (holdsDuring (YearFn ?Y) (likes Sue ?X))

Proof by LEO-II(+E) in 0.16s



## Example (4/5: Embedded Formulas (3 modified))

What holds that holds at all times. Mary likes Bill. During 2009 Sue liked whoever Mary liked. Is there a year in which Sue has liked somebody?

**A'**: (holdsDuring ?Y True)

**B**: (likes Mary Bill)

**C**: (holdsDuring (YearFn 2009)

(forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))

**Q**: (holdsDuring (YearFn ?Y) (likes Sue ?X))

## Example (4/5: Embedded Formulas (3 modified))

What holds that holds at all times. Mary likes Bill. During 2009 Sue liked whoever Mary liked. Is there a year in which Sue has liked somebody?

**A'**: `(holdsDuring ?Y (1 + 1 = 2))`

**B**: `(likes Mary Bill)`

**C**: `(holdsDuring (YearFn 2009)`

`(forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))`

**Q**: `(holdsDuring (YearFn ?Y) (likes Sue ?X))`

## Example (4/5: Embedded Formulas (3 modified))

What holds that holds at all times. Mary likes Bill. During 2009 Sue liked whoever Mary liked. Is there a year in which Sue has liked somebody?

**A'**: `(holdsDuring ?Y (forall (?P) (=> ?P ?P)))`

**B**: `(likes Mary Bill)`

**C**: `(holdsDuring (YearFn 2009)  
 (forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))`

**Q**: `(holdsDuring (YearFn ?Y) (likes Sue ?X))`

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**A'**: (holdsDuring ?Y True)

**B**: (likes Mary Bill)

**C**: (holdsDuring (YearFn 2009)

(forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))

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Boolean extensionality:  $(P \Leftrightarrow Q) \Leftrightarrow (P = Q)$

## Example (4/5: Embedded Formulas (3 modified))

What holds that holds at all times. Mary likes Bill. During 2009 Sue liked whoever Mary liked. Is there a year in which Sue has liked somebody?

**A'**: (holdsDuring ?Y True)

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**C**: (holdsDuring (YearFn 2009)

(forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))

**Q**: (holdsDuring (YearFn ?Y) (likes Sue ?X))

Proof by LEO-II(+E) in 0.08s

## Example (6: Embedded Formulas and KappaFn)

The number of people John is grandparent of is less than or equal to three. How many grandchildren does John at most have?

- A:** `(=> (grandchild ?X ?Y)  
 (exists (?Z) (and (parent ?Z ?X) (parent ?Y ?Z))))`
- B:** `(=> (grandparent ?X ?Y)  
 (exists (?Z) (and (parent ?X ?Z) (parent ?Z ?Y))))`
- C:** `(lessThanOrEqualTo  
 (CardinalityFn (KappaFn ?X (grandparent John ?X)))  
 3)`
- Q:** `(lessThanOrEqualTo  
 (CardinalityFn (KappaFn ?X (grandchild ?X John)))  
 ?Y)`

Proof by LEO-II(+E) in 0.34s



Significant Improvements since Paper Submission

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## LEO-II(+E) version v1.1

Ex.	1	2	3	4	5	6	7	8	9
local version	.19	.19	.13	.16	.08	.34	.18	.04	2642.55
SInE version	-	-	-	-	-	-	-	-	-
global version	-	-	-	-	-	-	-	-	-

One reviewer: ... only local versions ... this is not impressive ...

## LEO-II(+E) version v1.2.1 (with relevance filtering)

Ex.	1	2	3	4	5	6	7	8	9
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SInE version	.43	.40	.21	.54	.37	.12	.70	.06	.26
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Problem for SUO-KIF Semantics:  
Boolean Extensionality versus Modal Operators

## Example (5: Embedded Formulas – Temporal Contexts)

**A'**: `(holdsDuring ?Y True)`

**B**: `(likes Mary Bill)`

**C**: `(holdsDuring (YearFn 2009)  
 (forall (?X) (=> (likes Mary ?X) (likes Sue ?X))))`

**Q**: `(holdsDuring (YearFn 2009) (likes Sue Bill))`

Proof by LEO-II(+E) in < 0.16s

Boolean extensionality is in conflict with (epistemic) modalities!  
(Has Boolean extensionality ever been questioned for KIF?)

Problem relevant not only for HO-ATPs!

## Example (8: Embedded Formulas – Epistemic Contexts)

**A'**: (`knows` ?Y True)

**B**: (`likes` Mary Bill)

**C'**: (`knows` Chris

(forall (?X) (`=>` (`likes` Mary ?X) (`likes` Sue ?X))))

**Q'**: (`knows` Chris (`likes` Sue Bill))

Proof by LEO-II(+E) in 0.04s

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## Example (8: Embedded Formulas – Epistemic Contexts)

**A''**: (`knows` ?Y (forall (?P) (=> ?P ?P)))

**B**: (`likes` Mary Bill)

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**Q'**: (`knows` Chris (`likes` Sue Bill))

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# Proposed Solution: Possible World Semantics for SUMO

SUMO  $\longrightarrow$  Quantified Multimodal Logic (QML)  $\longrightarrow$  TPTP THF  
(QML is fragment of HOL (BenzmüllerPaulson, SR-2009-02, 2009))

- ▶ T-Box like information in SUMO:

(instance holdsDuring AsymmetricRelation)  $\longrightarrow$   
 $\forall W_t. (\text{instance holdsDuring AsymmetricRelation})_{t \rightarrow o} W$

- ▶ A-Box like information as in query problem: current world  $cw_t$

(likes Mary Bill)  $\longrightarrow$  (likes Mary Bill) $_{t \rightarrow o} cw$

(knows Chris (likes Sue Bill))  $\longrightarrow$   
( $\square_{\text{Chris}}$  (likes Sue Bill)) $_{t \rightarrow o} cw$

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- ▶ T-Box like information in SUMO:

(instance holdsDuring AsymmetricRelation)  $\longrightarrow$   
 $\forall W_{\iota}. (\text{instance holdsDuring AsymmetricRelation})_{\iota \rightarrow o} W$

- ▶ A-Box like information as in query problem: current world  $cw_{\iota}$

(likes Mary Bill)  $\longrightarrow$  (likes Mary Bill) $_{\iota \rightarrow o} cw$

(knows Chris (likes Sue Bill))  $\longrightarrow$   
( $\square_{\text{Chris}}$  (likes Sue Bill)) $_{\iota \rightarrow o} cw$

## Example (8: Embedded Formulas – Epistemic Contexts)

**A''**:  $\forall Y_{l \rightarrow l \rightarrow o} (\Box_Y \top) \text{ cw}$

**B**:  $(\text{likes}_{l^*} \text{ Mary Bill}) \text{ cw}$

**C'**:  $(\Box_{\text{Chris}} (\forall^i X_{\mu} ((\text{likes}_{l^*} \text{ Mary } X) \supset (\text{likes}_{l^*} \text{ Sue } X)))) \text{ cw}$

**Q'**:  $(\Box_{\text{Chris}} (\text{likes}_{l^*} \text{ Sue Bill})) \text{ cw}$

Axioms for  $\Box_{\text{Chris}}$  can be added:

**M**:  $\forall W_{l^*} (\forall^P \phi_{l \rightarrow o} \Box_{\text{Chris}} \phi \supset \phi) W$

**4**:  $\forall W_{l^*} (\forall^P \phi_{l \rightarrow o} \Box_{\text{Chris}} \phi \supset \Box_{\text{Chris}} \Box_{\text{Chris}} \phi) W$

**5**:  $\forall W_{l^*} (\forall^P \phi_{l \rightarrow o} \Box_{\text{Chris}} \neg \phi \supset \Box_{\text{Chris}} \neg \Box_{\text{Chris}} \phi) W$

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Axioms for  $\Box_{\text{Chris}}$  can be added:

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LEO-II(+E) cannot solve this problem anymore!

## Example (8: Embedded Formulas – Epistemic Contexts)

**A''**:  $\forall Y_{l \rightarrow l \rightarrow o} (\Box_Y \top) \text{ cw}$

**B**:  $(\Box_{Chris} (\text{likes Mary Bill})) \text{ cw}$

**C'**:  $(\Box_{Chris} (\forall^i X_\mu ((\text{likes Mary } X) \supset (\text{likes Sue } X)))) \text{ cw}$

**Q'**:  $(\Box_{Chris} (\text{likes Sue Bill})) \text{ cw}$

Axioms for  $\Box_{Chris}$  can be added:

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But LEO-II(+E) can solve this problem in 0.15s!

## Example (8: Embedded Formulas – Epistemic Contexts)

**A''**:  $\forall Y_{L \rightarrow L \rightarrow O} (\Box_Y \top) \text{ cw}$

**B**:  $(\Box_{\text{fool}} (\text{likes Mary Bill})) \text{ cw}$

**C'**:  $(\Box_{\text{Chris}} (\forall^i X_{\mu} ((\text{likes Mary } X) \supset (\text{likes Sue } X)))) \text{ cw}$

**Q'**:  $(\Box_{\text{Chris}} (\text{likes Sue Bill})) \text{ cw}$

Axioms for  $\Box_{\text{Chris}}$  can be added:

**M**:  $\forall W_{L^*} (\forall^P \phi_{L \rightarrow O} \Box_{\text{Chris}} \phi \supset \phi) W$

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Axioms for  $\Box_{\text{fool}}$  can be added ...

$\forall W_{L^*} (\forall^P \phi_{L \rightarrow O} \Box_{\text{fool}} \phi \supset \Box_{\text{Chris}} \phi) W$

...

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More information: (BenzmüllerPease, ECAI-ARCOE-10, 2010)



- ▶ SUMO (similarly Cyc) employs higher-order representations
- ▶ support with first-order ATPs good but not perfect
- ▶ additional support with higher-order ATPs seems feasible
  - ▶ translation SUO-KIF  $\rightarrow$  THF0
  - ▶ example problems solved effectively (in large theory context!) by LEO-II(+E)
  - ▶ simple relevance filtering mechanism implemented for LEO-II(+E)
- ▶ various problems in SUMO detected, including:
  - Boolean extensionality versus modal operators
- ▶ solution (BenzmüllerPease, ECAI-ARCOE-10, 2010)
  - ▶ possible world semantics for SUO-KIF resp. SUMO
  - ▶ exploitation of embedding of quantified multimodal logic in THF for automation with higher-order ATPs
  - ▶ supports combinations with further logic embeddings in THF0