Two Categorical Approaches To Knowledge Representation

Andrei Rodin

16 septembre 2014

Andrei Rodin Two Categorical Approaches To Knowledge Representation

Why Classical FOL?

Topos Logic

Homotopy Type Theory (HoTT)

Perspectives

イロン イヨン イヨン イヨン

3



Harmelen & Lifschitz & Porter (2008) Handbook of KR: Classical First-Order Logic (CFOL) is the logical backbone of KR. In particular CFOL plays this role in Descriptive Logics.



An ontological assumptions (commitment) according to which domain D of the relevant knowledge K_D is construed as a <u>set</u> of individuals aka *objects* O_D .

How this commitment brings about FOL?

イロン イヨン イヨン イヨン

æ

How this commitment brings about FOL?

Propositional calculus :

(i) Properties of O_D are accounted for extensionally as subdomains (= subsets) $S \subseteq D$; (ii) Classical Propositional Calculus fits the Boolean algebra of $S \subseteq D$

Naively : Bool and Venn ; Precisely : Tarski's topological model.

How this commitment brings about FOL?

Propositional calculus :

(i) Properties of O_D are accounted for extensionally as subdomains (= subsets) $S \subseteq D$;

(ii) Classical Propositional Calculus fits the Boolean algebra of $S \subseteq D$

Naively : Bool and Venn ; Precisely : Tarski's topological model.

Predicate calculus :

The (1-st order fragment of the) *internal* logic of *topos* of sets SET is CFOL. SET is the *only* topos having this property.

How this commitment brings about FOL?

Propositional calculus :

(i) Properties of O_D are accounted for extensionally as subdomains (= subsets) $S \subseteq D$; (ii) Classical Propositional Calculus fits the Boolean alge

(ii) Classical Propositional Calculus fits the Boolean algebra of $S \subseteq D$

Naively : Bool and Venn ; Precisely : Tarski's topological model.

Predicate calculus :

The (1-st order fragment of the) *internal* logic of *topos* of sets SET is CFOL. SET is the *only* topos having this property.

• Higher-order logical structure : idem.

CFOL belongs to SET

Andrei Rodin Two Categorical Approaches To Knowledge Representation

▲ロン ▲御と ▲注と ▲注と

Э

CFOL belongs to SET

▶ The Idea of SET : all sets with all maps (aka functions)

CFOL belongs to SET

- ▶ The Idea of SET : all sets with all maps (aka functions)
- Remark : the Classical 1st order logical structure belongs to the whole SET rather than to any of its single objects (= a single set).

CFOL belongs to SET

- ▶ The Idea of SET : all sets with all maps (aka functions)
- Remark : the Classical 1st order logical structure belongs to the whole SET rather than to any of its single objects (= a single set).
- Moral : Changing domains (contexts) is a fundamental logical operation. Function f : A → B "changes domain B for domain A".

CFOL belongs to SET

- ▶ The Idea of SET : all sets with all maps (aka functions)
- Remark : the Classical 1st order logical structure belongs to the whole SET rather than to any of its single objects (= a single set).
- Moral : Changing domains (*contexts*) is a fundamental logical operation. Function *f* : *A* → *B* "changes domain *B* for domain *A*".
- Lawvere Discovery : Right and left *adjoints* to substitution functor s_f along f are the existential quantifier ∃_f and ∀_f correspondingly.

소리가 소문가 소문가 소문가

A <u>constructive</u> principle of ontological anchoring/grounding of logic useful for CS :

Never use logic as if it were god-given. Always ground your logic with an appropriate hand-made ontology.

What is wrong about SET with CFOL?

<u>Problem 1</u>: <u>SET</u> is <u>static</u>. It is <u>the</u> static topos (Lawvere). For a simple example of a <u>dynamic</u> topos consider SET^{\circlearrowright} = topos of sets with autho-maps (= functions to itself).

What is wrong about SET with CFOL?

But knowledge is, generally, dynamic at least in these three ways :

< E

What is wrong about SET with CFOL?

But knowledge is, generally, dynamic at least in these three ways :

 ▶ (i) (any particular piece of) knowledge K_D can often be extended, revised, improved, disproved combined with some K'_{D'} or changed otherwise;

- 4 同 6 4 日 6 4 日 6

What is wrong about SET with CFOL?

But knowledge is, generally, dynamic at least in these three ways :

- ▶ (i) (any particular piece of) knowledge K_D can often be extended, revised, improved, disproved combined with some K'_{D'} or changed otherwise;
- (ii) K_D may degenerate because of change of D. In other words fixed K_D may outdate and fully expire. Ex. : Today's knowledge of (the present) Moscow weather becomes useless in several days. Such knowledge needs be updated.

・ロン ・回と ・ヨン・

What is wrong about SET with CFOL?

But knowledge is, generally, dynamic at least in these three ways :

- ▶ (i) (any particular piece of) knowledge K_D can often be extended, revised, improved, disproved combined with some K'_{D'} or changed otherwise;
- (ii) K_D may degenerate because of change of D. In other words fixed K_D may outdate and fully expire. Ex. : Today's knowledge of (the present) Moscow weather becomes useless in several days. Such knowledge needs be updated.
- (iii) In many cases K_D has a *local* character. In other words it varies over D rather than accounts for D statically. Ex. : Knowledge of today's weather various not only through time but also over the globe.

How to fix it?

All these problems are curried by replacing SET with some other toposes (which in many - but not all - cases can be set-based like SET^{\circlearrowright}):

How to fix it?

All these problems are curried by replacing SET with some other toposes (which in many - but not all - cases can be set-based like SET^{\circlearrowright}):

 (i) and (ii) : SET^{...} : stages of knowledge and temporal stages (correspondingly)

How to fix it?

All these problems are curried by replacing SET with some other toposes (which in many - but not all - cases can be set-based like SET^{\circlearrowright}):

- (i) and (ii) : SET^{...} : stages of knowledge and temporal stages (correspondingly)
- (iii) Topos Sh(T) of shaves over a topological space T or (more generally) a site T (Grothendieck topology)

Unless a given topos E is SET its internal logic L_T is not classical but intuitionistic. It also has specific features that reflects geometrical features of T. If $E = SET^{\dots}$ then the (category of) truth-values for L_T is \dots . If E = Sh(T) then the (category of) truth-values for L_T is T.

Lawvere 1970

[A] Grothendieck "topology" appears most naturally as a modal operator, of the nature "it is locally the case that", the usual logical operators, such as \forall , \exists , \Rightarrow have natural analogues which apply to families of geometrical objects rather than to propositional functions.

・ロン ・回と ・ヨン ・ヨン

Conclusion of the above Argument

It is more useful to construe a domain of knowledge D as a general topos rather than *SET*. Topos (intuitionistic) logic L_D can better serve for KR than CFOL.

How to do this in practice?

・ロト ・回ト ・ヨト ・ヨト

æ

How to do this in practice?

- (i) to construe D as a category :
 to find an appropriate notion of *transformation* (=
 - categorical morphisms) btw objects of D; to define the (partial) composition of morphisms and study its algebra

・ロン ・回と ・ヨン・

How to do this in practice?

- ▶ (i) to construe *D* as a category :
 - to find an appropriate notion of *transformation* (= categorical morphisms) btw objects of D; to define the (partial) composition of morphisms and study its algebra
- (ii) grant that D is a topos by providing D with the terminal object, pullbacks, etc.
 - exponentials
 - truth-value object

Useful theorem

If D is a small category then $\hat{D} = SET^{D}$ is a topos in which D plays the role of truth-value object (pre-sheafification). \hat{D} is a categorical *completion* of D (Yoneda embedding).

Corollary 1 : In many contexts one can replace D by \hat{D} (does this work for KR?);

<u>Corollary 2</u>: When *D* is construed as a site then one may use $\overline{Sh(D)}$ instead of \hat{D} (sheafification). This move provides the domain of knowledge in question with a geometrical structure (coherent with its internal logical structure).

・ロン ・回 と ・ ヨ と ・ ヨ と



The construals of \hat{D} and Sh(D) still essentially involve SET !

Andrei Rodin Two Categorical Approaches To Knowledge Representation

・ロト ・回ト ・ヨト ・ヨト

3

What is wrong about SET with CFOL?

<u>Problem 2</u>: CFOL does not reflect how work computers! *SET* is a purely speculative (and under some interpretations metaphysical) construal, which does not reflect the usual computing environment. *FSET* \subset *SET* may indeed reflect some features of primitive human experience like manipulations with pebbles. But *SET* certainly doesn't!

(D) (A) (A) (A) (A)

What is wrong about SET with CFOL?

<u>Problem 3</u>: CFOL-based KR represents only the *propositional* knowledge aka *knowledge-that*. Arguably there is also the non-propositional *knowledge-how* irreducible to the propositional *knowledge-that* (Fantl). My analysis of mathematical knowledge (from Euclid on) justifies this view and moreover shows that the two types of knowledge are intertwined at some very basic level of mathematical reasoning.



How to build an ontology fairly constructively? How to represent non-propositional knowledge? Here's how : use the <u>constructive</u> logic and mathematics for it.

Martin-Lof circa 1980

A constructive type theory (MLTT) :

Martin-Lof circa 1980

A constructive type theory (MLTT) :

The idea (Brouwer, Kolmogorov et al.) : a proposition is true iff it has a proof; LEM is not justified.

Martin-Lof circa 1980

A constructive type theory (MLTT) :

- The idea (Brouwer, Kolmogorov et al.) : a proposition is true iff it has a proof; LEM is not justified.
- propositions are types among some other types (proposition-as-types paradigm in CS; cf. Curry-Howard isomorphism). Logic is a proper *part* of a larger constructive framework.

Martin-Lof circa 1980

A constructive type theory (MLTT) :

- The idea (Brouwer, Kolmogorov et al.) : a proposition is true iff it has a proof; LEM is not justified.
- propositions are types among some other types (proposition-as-types paradigm in CS; cf. Curry-Howard isomorphism). Logic is a proper *part* of a larger constructive framework.
- terms of a proposition-type are proves of this proposition.

Voevodsky circa 2010

MLTT is internal for the (categorically-construed) higher homotopy theory. Under this interpretation MLTT (possibly extended with some further axioms) is known as HoTT. Making a (formal) proof in HoTT is a special case of making a construction. Cf. Euclid.

Solutions :

<ロ> (四) (四) (注) (注) (三)

Solutions :

Problem 2 : MLTT and hence the (limited) HoTT is computable. It is implemented through Coq proof assistant.

Solutions :

- Problem 2 : MLTT and hence the (limited) HoTT is computable. It is implemented through Coq proof assistant.
- Problem 3 : MLTT first principles are constructive rules (including rules of inference for proposition-based judgements), not propositions or propositional forms. In HoTT these rules have a geometrical meaning. HoTT constructions like Euclid's geometrical constructions are basically complex rules build with elementary rules taken for granted. This structure seems me appropriate for representing the *knowledge-how* (without reducing it to certain propositional *knowledge-that*.

Perspectives :

Jakob Lurie's ongoing work points to a convergence and possible synthesis of the two above approaches in what he calls the *HIgher Topos theory* (2009). The idea is to make HoTT into the internal language of a wider higher-order topos-like framework, which would allow for making truth-evaluation for HoTT internally. (Observe that MLTT doesn't provide this option !)

A lot needs to be done in order to implement at least some of the discussed theoretical possibilities in practice. However it worths trying.

THANK YOU!

Andrei Rodin Two Categorical Approaches To Knowledge Representation

< □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □