## Modern Type Theories and Their Applications

Zhaohui Luo Royal Holloway, Univ of London

Zhaohui.Luo@hotmail.co.uk https://www.cs.rhul.ac.uk/home/zhaohui/

## This talk – two parts

- I. Modern Type Theories: brief introduction
  - ✤ Basics of MTTs
  - Meta-theory and meaning theory
  - \* Application in proof assistants based on MTTs
- II. Two applications of MTTs:
  - Univalent foundations & homotopy type theory
  - \* Formal semantics in MTTs (MTT-semantics)

## (\*) Note: two forms of type systems

- Type systems (for programming languages)
  - \* Type systems (Milner, ...) in ML, Haskell, ...
  - \* General recursion, polymorphism, modules, ...
  - No consistent logic under propositions-as-types principle
- Type theories (in proof assistants)
  - ✤ Type theories (Martin-Löf, …) in Agda, Coq, Lego, …
  - Dependent/inductive/logical/... types
  - Consistent logic under propositions-as-types principle
- This talk is about the 2<sup>nd</sup>, with occasional comparisons.

## Part I. Modern Type Theories

## Origin of type theory

#### Foundations of mathematics and paradoxes

- Naïve set theory (Cantor, ...)
- Paradox in naïve set theory (Russell 1903) [next slide]
- \* Crisis in foundations of mathematics
- Set theory by Zermelo
  - Axiomatic set theory (1908; later ZFC etc.)
  - Widely accepted foundations in math community
- Type theory by Russell
  - \* Ramified type theory (*Principia Math.* 1910-13, 1925)
  - ✤ Vicious circle principle ("impredicativity" like ∀X.X)
  - Ramified hierarchy problematic "axiom of reducibility"







May 2024

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#### Russell's paradox in naïve set theory

Naïve concept of set with unrestricted comprehension: { x | P(x) } for any predicate P in FOL
Russell's paradoxical set would exist if we accepted this: R = { x | x ∉ x }
Then, by definition, we would have an absurd equivalence: R ∈ R ⇔ R ∉ R (\*)

♦ BTW, R exists  $\rightarrow$  (\*)  $\rightarrow$  logical inconsistency.

## Simple type theory

#### Ramsey (1926)

- ✤ Logical v.s. semantic paradoxes
- Russell's paradox v.s. (e.g.) Liar's paradox
- Impredicativity is circular, but not vicious
- ✤ So, Russell's ramified TT can be "simplified" to simple TT.
- Church's simple type theory (1940)
  - \* Formal system based on  $\lambda$ -calculus
  - ∗ Types as in ramified TT (e, t, e→t, ...)
  - ✤ Higher-order logic (formulas like ∀X.X)
  - \* Wide applications (Montague semantics, proof assistants, ...)

Note: "Simple" could have another meaning: only "simple" types ...





## Modern Type Theories

Martin-Löf has introduced/employed

- Judgements, contexts, definitional equality
- Dependent/inductive types, type universes
- Curry-Howard principle of propositions-as-types



- Examples of MTTs [& implementing proof assistants]:
  - Predicative TTs:
    - MLTT Martin-Löf's type theory [1975]; Agda
  - Impredicative TTs:
    - ♦ CC [Coquand & Huet 1988] and pCIC; Coq/Lean
    - ✤ UTT [Luo 1990, 1994]; Lego/Plastic

## UTT – an example MTT

#### UTT – Unifying theory of Dependent Types (MLTT + CC) [Luo 1994, Oxford Univ Press]

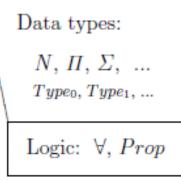
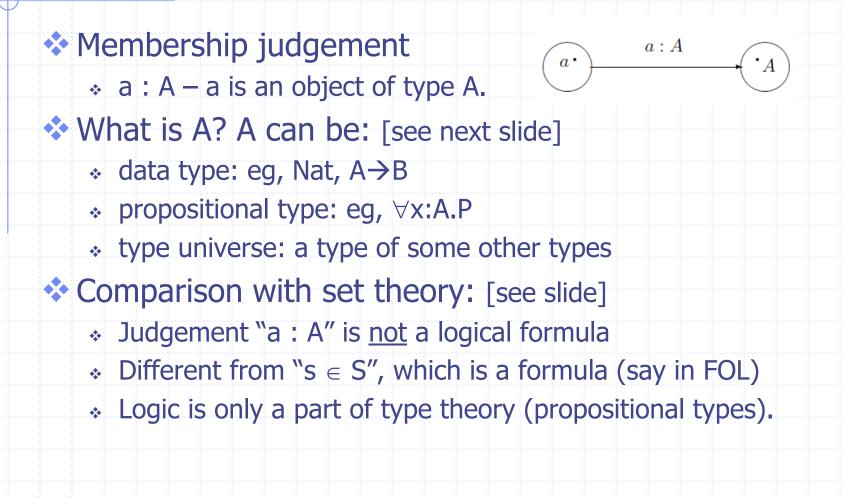


Fig. 1. The type structure in UTT.

#### UTT has nice meta-theoretic properties

- Goguen's PhD thesis on "Typed Operational Semantics" (1994)
- ✤ Strong normalisation, which implies, e.g., consistency etc.

#### Judgements – basic notion in type theory

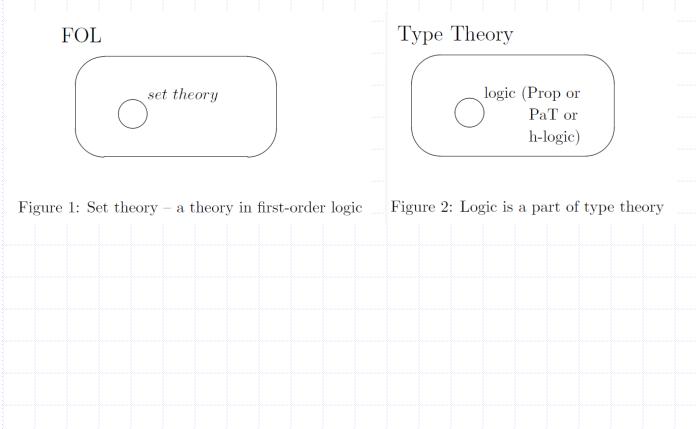


#### $\Pi$ -types and $\forall$ -props: examples of dependent types

 $\therefore$   $\Pi x: A.B(x) - dependent function type$  $\Gamma \vdash A \ type \quad \Gamma, \ x:A \vdash B \ type$  $\Gamma \vdash \Pi x: A.B \ type$ ✤ Type for collection  $\Gamma, x:A \vdash b:B$  $\{ f \in A \rightarrow \bigcup_{a \in A} B(a) \mid \forall a \in A. f(a) \in B(a) \}$  $\Gamma \vdash \lambda x : A \cdot b : \Pi x : A \cdot B$ \*  $f: \Pi x: Human. Parent(x)$  $\Gamma \vdash f : \Pi x : A \cdot B \quad \Gamma \vdash a : A$  $\rightarrow$  f(h) is father/mother of h (not others!)  $\Gamma \vdash f(a) : [a/x]B$  $\Gamma, x:A \vdash b: B \quad \Gamma \vdash a: A$ Universal quantification  $\Gamma \vdash (\lambda x : A \cdot b)(a) = [a/x]b : [a/x]B$  $\Gamma \vdash A \ type \quad \Gamma, \ x : A \vdash P(x) : Prop$  $\Gamma \vdash \forall x : A.P(x) : Prop$  Prop, the collection of propositions, is a type itself [impredicative universe with "circular" props like  $\forall X$ :Prop.X]

Propositions-as-types: propositions are (some) types
 [So, logic(s) is only a part of type theory – see next slide.]

## Relationship between logic and set/type theory



#### Inductive types: an example

- Peano axioms: logical theory for natural numbers. [N is a predicate and n ∈ N stands for N(n)]
  - $(P1) \ 0 \in N$
  - $(P2) \ \forall x. \ x \in N \Rightarrow succ(x) \in N$
  - $(P3) \ \forall x, y. \ x, y \in N \land succ(x) = succ(y) \Rightarrow x = y$
  - $(P4) \ \forall x. \ x \in N \Rightarrow 0 \neq succ(x)$

 $(P5) \ \forall P. \ P(0) \land [\forall x. \ x \in N \land P(x) \Rightarrow P(succ(x))] \Rightarrow \forall z. \ z \in N \Rightarrow P(z)$ 

#### Martin-Löf's idea

- Inductive types as "computational theories"
- Example Nat, the type of natural numbers

## **Rules for Nat**

#### Formation and introduction rules

 $\overline{Nat \ type} \qquad \overline{0:Nat} \qquad \frac{n:Nat}{succ(n):Nat}$ 

Elimination rule

$$\Gamma, z : Nat \vdash C(z) \ type \quad \Gamma \vdash n : Nat$$
$$\Gamma \vdash c : C(0) \quad \Gamma, x : Nat, y : C(x) \vdash f(x, y) : C(succ(x))$$
$$\Gamma \vdash \mathcal{E}_{Nat}(c, f, n) : C(n)$$

Notes:

- ✤ Introduction rules specify canonical objects.
- Elimination rule is Nat-induction + primitive recursion.
- \* All Peano axioms are either rules or provable.

## (\*) Two notions of typing (c.f. [Luo et al. 2012])

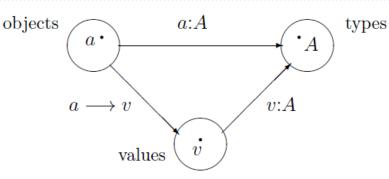
#### Type assignment

- ✤ Types and objects exist independently.
- Types are assigned to objects.
- \* Therefore, it may be natural to have type polymorphism.
- Types with canonical objects
  - ✤ Types and objects <u>do not</u> exist independently.
  - Types consist of canonical objects and the existence of these objects depends on that of the type (by introduction rules).
    - [Canonical nats 0 and succ(n) don't exist if Nat does not.]
  - ✤ Therefore, it is not unnatural to have type uniqueness.

This also leads to two different views of subtyping (see later).

## Meaning explanation

#### Understanding based on computation:



Example: A = Nat, a = 3+4, v = 7.

♦ How to guarantee that computation  $a \rightarrow v$  terminates !?

- Meta-theoretic study (eg, strong normalisation of UTT)
- Meaning-theoretic argument (harmony of intro/elim rules)



## Meta-theory

#### Meta-theory of type theories

- Computation is central.
  - Strong normalisation: All computations terminate.
  - This usually implies canonicity and logical consistency.
- \* Sophisticated, tedious and rather hard to do
  - Many many theorems/lemmas/concepts/... [examples in next 2 slides]
- \* ECC/UTT's meta-theoretic studies [Luo 1990, Goguen 1994]

Caveat:

- Meta-theory depends on consistency of meta-language (set theory) – believed to be true, but ...
- Desire/wish: can we argue for "correctness" directly?

#### Meta-theoretic theorems: examples

Church-Rosser theorem (CR)  $\Rightarrow$  If a=b : A, then there exists c : A s.t. a → c and b → c. Subject Reduction (SR)  $\bullet$  If a : A and a → b, then b : A. Strong Normalisation (SN) \* Every computation from a well-typed term terminates. Logical consistency (in UTT)  $* \forall X: Prop.X$  (false) is not provable (in the empty context). Decidability (of type-checking) It is decidable whether a judgement is correct (derivable).

## Example proof: logical consistency

#### Proof (of consistency)

- \* Assume that  $M : \forall X: Prop. X$ .
- ✤ By SN & SR, we may assume that M is in normal form.
- \* So,  $M = \lambda X$ :Prop.M' s.t. X:Prop |- M' : X for some M'=M<sub>1</sub>...M<sub>n</sub>X (or other forms of "base term").
- But we can then show that this would imply either Prop = X or Prop = Qx:A.B which, by CR, is impossible.
- ☆ Therefore, M does not exist (∀X:Prop.X is not provable).



## Theories of meaning

Meaning is reference ("referential theory")

 Word meanings are (abstract/concrete) objects.
 c.f., platonism: Frege, ...

 Meaning is concept ("internalist theory")

 Word meanings are ideas in the mind.
 c.f., Aristotle, Chomsky, ...

 Meaning is use ("use theory")

 Word meanings are understood by its uses.
 c.f., Wittgenstein, ...







#### Proof-theoretic semantics – use theory for logics

#### Proof-theoretic semantics

- Use theory for logical systems
- ✤ Dummett, Prawitz, …

#### Ideas



- <u>Pre-mathematical</u> justification of logical rules (informally from "first principles", not meta-theoretically)
- ✤ For logic: two aspects of use verification and consequence
- \* Harmony: intro/elim rules should be harmonious.
- Proof-theoretic semantics for type theories
  - Martin-Löf's meaning explanations (1984)
  - ✤ Type theory potentially has PTS, while set theory does not.
  - ✤ Current investigations: hypothetical judgements, impredicativity, ...

## Proof technology based on type theories

#### Proof assistants – interactive proof development MTT-based: Agda, Coq, Lean, Lego, NuPRL, Plastic, ... \* HOL-based: HOL, Isabelle, ... Applications of proof assistants Formalisation of mathematics 4-colour theorem (Coq), Kepler conjecture (Isabelle) Univalent foundations of mathematics \* Computer Science: program verification and advanced programming Computational Linguistics NL reasoning based on <u>MTT-semantics</u> (Coq)

## Part II. Two applications of MTTs

- Univalent foundations & homotopy type theory
- Formal semantics in MTTs (MTT-semantics)

## Part II(1) Univalent foundations of mathematics

#### Univalent Foundations – alternative to set theory

#### Vladimir Voevodsky (1966–2017)

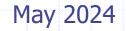
- Russian mathematician; Fields medalist (2002);
  - Professor at Inst of Advanced Study, Princeton, USA
- Worked on UF since 2005 (homotopy lambda calculus), developed UF library in Coq from 2010.



V. Voevodsky. An experimental lib of formalized math based on UF. MSCS, 2015.

#### Voevodsky's key motivations and ideas

- ✤ Proof-checking we need foundations that make it possible.
  - Errors in his own papers, only discovered/confirmed 15/20 yrs later ...
- \* Groupoid conception for higher dimensional math.
  - Sroupoids, rather than categories, are "sets in the next dimension".
- H-levels (homotopy levels of n-types) [Voevodsky 2009]
  - Propositions, sets, groupoids, ...



## Homotopy type theory (HoTT 2013)

## Development of HoTT

- Formalisation of univalent foundations
- Special year on univalent foundations of math.
   2012-13 at Inst of Advanced Study, Princeton, USA.

#### Hott = MLTT + UA + HITs

- ✤ UA univalence axiom
- ✤ HITs higher inductive types

Homotopy Type Theory

### Univalence

# ❖ Univalence axiom (≅/Id for equivalence/identity of types): (UA) Id(A,B) ≅ (A ≅ B)

- Mathematical structuralism (invariance under equivalence)
  - ♦ UA is "unusual" (AxB  $\cong$  BxA they have same <u>expressible</u> properties.)
- \* UA implies extensionality, both functional and propositional.
  - Note: Mathematics is extensional!
  - HoTT v.s. Extensional TT [Martin-Löf 1984] (ETT is problematic)
- UA as an <u>axiom</u> (in HoTT)?
  - \* "Axioms" are problematic in type theory!
  - \* With axioms, canonicity fails to hold.
    - Some "natural numbers" don't compute to canonical ones ...
    - Correctness/adequacy of the foundational language is in doubt ...!

#### Cubical type theory (Coquand et al, TYPES15, LICS18, ...)

#### Cubical type theory

- Research started in 2012-13 at Princeton, by Coquand et al, when Voevodsky had the conjecture: canonicity holds.
- Univalence is a <u>theorem</u> in the cubical type theory.
  - ☆ Canonicity for nats holds a big step forward!
  - Normalisation and decidability? (to be proved)
- Experimental implementation in Agda-Cubical
- Q: Is the cubical type theory the correct solution?

## Higher inductive types

#### Basic idea of HITs:

- Ordinary induction is only about "points" (eg, 0 & succ(n)).
- Higher induction extends it to "equalities/paths".
- Quotient types "A/R" typical example (with ad hoc notation =)
  |\_| : A -> A/R
  - $\forall x, y: A. R(x, y) \rightarrow |x| = |y|$
  - Quotient types were problematic ("setoid hell") so real progress!
  - \* Current implementation (eg, Agda-cubical) still a bit cumbersome.
- Notes: Several research topics, including:
  - General schemata for HITs (still unknown)
  - Independent understanding of HITs



### Direct v.s. indirect formalisations (side remark)

- Type theory is more effective (much more) when built-in entities are used <u>directly</u>.
- Application examples:
  - Formalisation of mathematics
    - Hott-based proof development (e.g., HITs for quotients) [Hott 2013]
    - In contrast with, e.g., setoids and related proofs (cumbersome ...)
  - Program verification
    - ✤ Built-in functions as FP programs (and their verification)
    - In contrast with, e.g., "deep embedding + semantics" (cumbersome ...)
  - Linguistic semantics
    - CNs-as-types in MTT-semantics (see below)
    - ✤ In contrast with, e.g., CNs-as-predicates in Montague semantics.

## Part II(2). MTT-semantics

## **Type-Theoretical Semantics**

#### Montague semantics (Montague 1930–1971)

- ✤ MG: formal natural language semantics in set theory
- Dominating in linguistic semantics since 1970s
- ✤ Set-theoretic, using simple type theory as intermediate

#### MTT-semantics: formal semantics in modern type theories

- ✤ Ranta (1994): formal semantics in Martin-Löf's type theory
- - ✤ Z. Luo. Formal Sem. in MTTs with Coercive Subtyping. L&P 35(6). 2012.
  - S. Chatzikyriakidis and Z. Luo. Formal Semantics in MTTs. Wiley, 2020. (monograph on MTT-semantics)
- \* Research context on rich typing in NL (many researchers ...)
  - S. Chatzikyriakidis and Z. Luo (eds.) Modern Perspectives in Type Theoretical Semantics. Springer, 2017.



#### **MTT-semantics:** basic categories

Category	Semantic Type		
S	Prop (the type of all propositions)		
CNs (book, human,)	) types (each common noun is interpreted as a type)		
IV	$A \rightarrow Prop$ (A is the "meaningful domain" of a verb)		
Adj	$A \rightarrow Prop$ (A is the "meaningful domain" of an adjective)		
Adv	$\square$ A:CN.(A $\rightarrow$ Prop) $\rightarrow$ (A $\rightarrow$ Prop) (polymorphic on CNs)		

Simple example: [John talks] = talk(j) : Prop

where j : Human and talk : Human  $\rightarrow$  Prop.

(\*) In MTT-semantics, common nouns (CNs) are types rather than predicates as in Montague semantics.

## Modelling Adjectival Modification: Case Study

Classical classification	Example	Characterisation	MTT-semantics
intersective	handsome man	Adj(N) 🗲 N & Adj	∑x:Man.handsome(x)
subsective	large mouse	Adj(N) → N (Adj depends on N)	large : ∏A:CN. A→Prop large(mouse) : Mouse→Prop
privative	fake gun	Adj(N) → ¬N	$G = G_R + G_F$ with $G_R \leq_{inl} G, G_F \leq_{inr} G$
non-committal	alleged criminal	Adj(N) → nothing	H <sub>h,Adj</sub> : Prop→Prop

[Chatzikyriakidis & Luo 13, 17 & 20; Luo, Shi & Xue 22]

## Note on Subtyping in MTT-semantics

#### Simple example

- ✤ A human talks. Paul is a handsome man. Does Paul talk?
- Semantically, can we type talk(p)?
  - ↔ talk : Human→Prop and p : [handsome man]
- \* Yes, because p : [handsome man]  $\leq$  Man  $\leq$  Human

#### Subtyping is crucial for MTT-semantics

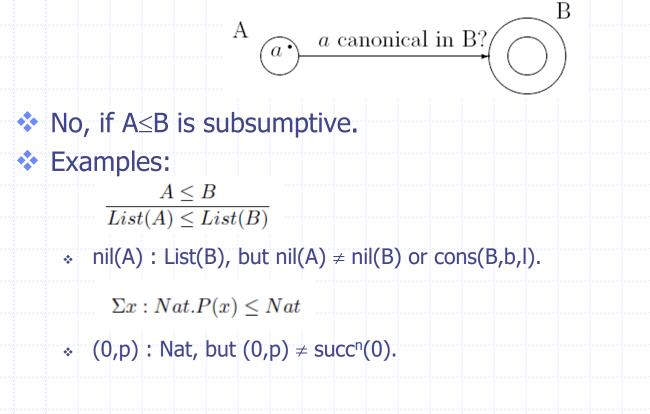
- ☆ Coercive subtyping [Luo 1999, Luo, Soloviev & Xue 2012] is adequate for MTTs and we use it in MTT-semantics.
- Note: Traditional subsumptive subtyping is inadequate for MTTs
   Canonicity fails with subsumptive subtyping.

## (\*) Two notions of subtyping

Corresponding to type assignment & canonical objects Subsumptive subtyping (A  $\leq$  B)  $a: A \leq B$ \* "Simple" & widely accepted (esp for PLs) a: B Unfortunately, not suitable for MTTs (eg, canonicity fails) **Coercive subtyping** (A  $\leq_{c}$  B) [Luo 97, Luo, Soloviev & Xue 12] Subtyping as abbreviations (implicit coercions) General & flexible (eg, projective subtyping)  $\blacktriangleright c(a)$  Conservativity over original MTT (properties preserved)  $\Gamma, y: B \vdash f(y): C(y) \quad \Gamma \vdash a: A \quad \Gamma \vdash A \leqslant_c B$  $\Gamma \vdash f(a) = f(c(a)) : C(c(a))$ 

## (\*) Canonicity fails in subsumptive subtyping

• Q: If A $\leq$ B and a is canonical in A, is it canonical in B?



#### Advanced features in MTT-semantics: examples

Copredication and dot-types [Luo 09, XL 12, CL 18]
 Linguistic coercions via coercive subtyping [Asher & Luo 12]
 Signatures for linguistic contexts [Luo 14, Lungu & Luo 16]
 MTT event sem. (dependent event types) [Luo & Soloviev 17]
 Propositional forms of judgemental inter. [Xue et al 18, 23)]
 MTT-semantics in MLTT<sub>h</sub> [Luo (LACompLing 2018)] (\*)
 CNs as setoids [Luo 12, CL 18] (and CNs as HITs – in progress)
 Dependent categorial grammar [Luo 24]

(\*) MTT-semantics in a predicative type theory? – next two slides.

#### MTT-semantics in Martin-Löf's TT – a problem

#### Martin-Löf's type theory in formal semantics

- Munnick, Sundholm, Ranta & many others
- All use PaT logic propositions as types.
- But Martin-Löf goes one step further: types = propositions!
- ✤ This is where the problem arises [Luo (LACL 2012)].

Example: a handsome man is (m,p) : Σx:Man.handsome(x)

- Two handsome men are the same iff they are the same man (and how to prove they are handsome should be irrelevant!)
- Proof irrelevance (any two proofs of the same proposition are the same.)
- \* But, in MLTT with PaT logic, this would mean every type collapses! Absurd.
- So, MLTT with PaT logic is <u>inadequate</u> for MTT-semantics.
  - \* Developing MTT-semantics in UTT is OK where proof irrelevance is possible.

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## MLTT<sub>h</sub>: Extension of MLTT with H-logic

#### H-logic ("H" for h-levels due to Voevodsky)

- A proposition is a type with at most one object.
- ★ Logical operators (examples):
  ★  $P \supset Q = P \rightarrow Q$  and  $\forall x:A.P = \prod x:A.P$

where |A| is propositional truncation (a form of HITs).

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#### • $MLTT_h = MLTT + h-logic$ (subsystem of HoTT) [Luo 2019]

- \* Proof irrelevance is "built-in" in h-logic (by definition).
- $\diamond$  Note: MLTT<sub>h</sub> is a <u>proper extension</u> of MLTT.
- $\ast\,$  Claim: MLTT<sub>h</sub> is adequate for MTT-semantics.

## Research monograph on MTTs in Chinese



罗朝晖:现代类型论的发展与应用。 清华大学出版社,2024年。

Z. Luo. Modern Type Theories: Their Development and Applications. Tsinghua Univ Press, 2024. (In Chinese)

网址: http://www.tup.tsinghua.edu.cn/booksCenter/book\_09109701.html

May 2024

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