# HOL Theorem Proving and Formal Probability (1)

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#### Aims of this Course

- Introduction to interactive theorem proving (ITP)
- Hands-on experience with HOL4
- Core theories of HOL4 (num, list, ...)
- Core Math theories of HOL4 (pred\_set, real, ...)
- Formal probability theory (with measure theory and Lebesgue integration)
- Learn how to prove simple probability theroems
- **...**

(NOTE: some slides used materials from the slides of Thomas Tuerk)



## Formal Verification and Theorem Proving

- **Formal verification** (aka formal methods) is the act of proving or disproving the correctness of intended algorithms underlying a system w.r.t. certain formal specifications, using mathematical methods.
- □ Traditional formal verification techniques: **Model Checking**, **Testing** and **Theorem Proving**.
- Model Checking: fully automated (pros); state-explosion problem (cons, cf. SPIN vs. SMV)
- Testing: good for disproving; incapable for proving.
- Theorem Proving: good for proving; bad for disproving; expensive logics (non-decidable); tedious proofs (time consuming).



# Mathematical (Informal) Proofs vs Formal Proofs

Mathematical (Informal, Pencil-and-paper) Proofs:

- informal, convinces other mathematicians
- checked by community of domain experts ("elders")
- subtle errors are hard to find
- often short, but may require creativity and brilliant ideas; with gaps

Formal Proofs:

- encoded in a logical formalism
- checkable by stupid machines
- trustworthy
- often long and tedious



## Automated vs. Manual Proofs

#### Automated Proofs (e.g. ACL2):

- amazing successes in certain domains (e.g., SAT solving)
- still, often infeasible for interesting problems
- hard to get insights in case a proof attempt fails
- even if it works, it is often not that automated (heuristics still needed)
- Manual Proofs: (e.g. HOL88)
- very tedious; one has to grind through many trivial but detailed proofs
- easy to make mistakes (more code more mistakes);
- hard to maintain (if anything changed)



# (Modern) Interactive Proofs

- combine strengths of manual and automated proofs
- typically the human user
  - provides insights into the problem
  - structures the proof
  - provides main arguments
- typically the computer
  - checks the proof
  - keeps track of all used assumptions
  - provides automation to grind through lengthy, but trivial proof steps
- automated provers (with or w/o proof logging) are locally used in interactive proofs



# The LCF (Logic of Computable Functions) Approach

- implement an abstract datatype thm to represent theorems
- semantics of ML ensure that values of type thm can only be created using its interface
- interface is very small
  - predefined theorems are axioms
  - function with result type theorem are inferences
- interface is carefully designed and checked
  - size of interface and implementation allow careful checking
  - one checks that the interface really implements only axioms and inferences that are valid in the used logic
- whenever you create a theorem, there is a proof for it
- proved theorems can be stored on disk, without having its proof (i.e. proof logging is optional)



## Higher Order Logic and HOL4

- Higher Order Logic = classical higher order predicate calculus with terms from the typed  $\lambda$ -calculus (i.e. simple type theory)
- HOL **Logic** vs HOL **Theorem Prover** (HOL4, the software)
- HOL4 extends the Standard ML platform with more packages

Standard ML is used for:

- Implementing the HOL theorem prover (kernel and utilities)
- User to writing formal proofs
- User to write custom proof tools (e.g. decision procedures)



# **HOL** Types

Type grammar:

$$\sigma ::= \alpha \mid c \mid (\sigma_1, \dots, \sigma_n) \circ p \mid \sigma_1 \to \sigma_2$$

- **Type variables**  $(\alpha, \beta, ...)$ : arbitrary (non-empty) sets in the universe  $\mathcal{U}$
- **Atomic types** (c): fixed sets in the universe. Initial atomic types: bool and ind.
- **Compound types**. The type  $(\sigma_1, ..., \sigma_n) op$  denotes the set resulting from applying the operation denoted by op to the sets denoted by  $\sigma_1, ..., \sigma_n$ .
- **Function types**. If  $\sigma_1$  and  $\sigma_2$  are types, then  $\sigma_1 \to \sigma_2$  is the function type with domain  $\sigma_1$  and codomain  $\sigma_2$ . It denotes the set of all (total) functions from the set denoted by its domain to the set denoted by its codomain.



### **HOL** Terms

Term grammar:

$$t := x \mid c \mid tt' \mid \lambda x.t$$

Term grammar (showing types):

$$t_{\sigma} ::= x_{\sigma} \quad | \quad c_{\sigma} \quad | \quad (t_{\sigma_1 \to \sigma_2} t'_{\sigma_1})_{\sigma_2} \quad | \quad (\lambda x_{\sigma_1} \cdot t_{\sigma_2})_{\sigma_1 \to \sigma_2}$$

- $\square$  Variables (free and bound): x, y, ...
- $\Box$  Constants (c)
- $\Box$  Function applications (t t', f(x) or fx)
- $\square$   $\lambda$ -Abstractions  $(\lambda x. t)$
- Terms must be well-typed (in function applications).



# The Theory MIN (part of bool)

What's contained in this initial theory:

- ☐ The type constant bool of Booleans.
- The binary type operator ('a, 'b)fun (or  $\alpha \to \beta$ ) of functions.
- ☐ The type constant ind (rarely used directly) of individuals.
- $\blacksquare$  Equality (=:  $\alpha \to \alpha \to bool$ ) is an infix operator.
- Implication ( $\Rightarrow$ : bool  $\rightarrow$  bool) is the material implication and is an infix operator that is right-associative.
- **Choice**: if t is a term having type  $\sigma \to \text{bool}$ , then @x.t(x) denotes some member of the set whose characteristic function is t.

No theorems or axioms are placed in theory min. The primitive rules of inference of HOL depend on the presence of min.

# Primitive Rules of Inference of the HOL Logic

1. Assumption introduction: ASSUME : term -> thm

$$t \vdash t : \texttt{bool}$$

2. Reflexivity: REFL : term -> thm  $\overline{\vdash t = (t : \alpha)}$ 

3. 
$$\beta$$
-conversion: BETA\_CONV : term -> thm  $\vdash (\lambda(x:\alpha).t_1:\beta)(t_2:\alpha) = t_1[x\mapsto t_2]:\beta$ 

4. Substitution:

$$\frac{\Gamma_1 \vdash t_1 = t_1' \quad \cdots \quad \Gamma_n \vdash t_n = t_n' \quad \Gamma \vdash t[t_1, \dots, t_n]}{\Gamma_1 \cup \cdots \cup \Gamma_n \cup \Gamma \vdash t[t_1', \dots, t_n']}$$



$$\frac{\Gamma \vdash t_1 = (t_2 : \beta)}{\Gamma \vdash (\lambda(x : \alpha).t_1) = (\lambda x.t_2) : \alpha \to \beta}$$

6. Type instantiation: INST\_TYPE : ...
$$\frac{\Gamma \vdash t}{\Gamma[\sigma_1, \dots, \sigma_n/\alpha_1, \dots, \alpha_n] \vdash t[\sigma_1, \dots, \sigma_n/\alpha_1, \dots, \alpha_n]}$$

7. Discharging an assumption: DISCH : term 
$$\rightarrow$$
 thm

$$\frac{\Gamma \vdash t_2 : \texttt{bool}}{\Gamma - \{t_1\} \vdash (t_1 : \texttt{bool}) \Rightarrow t_2}$$

8. Modus Ponens: MP : thm -> thm -> thm 
$$\frac{\Gamma_1 \vdash (t_1 : \texttt{bool}) \Rightarrow (t_2 : \texttt{bool}) \quad \Gamma_2 \vdash t_1}{\Gamma_1 \cup \Gamma_2 \vdash t_2}$$



# The theory LOG (part of bool)

The logical constants:

- True:  $T = ((\lambda(x : bool).x) = (\lambda x.x))$
- **Forall** (!):  $\forall = \lambda(P : \alpha \rightarrow bool).P = (\lambda x.T)$
- **Exists** (?):  $\exists = \lambda(P : \alpha \rightarrow bool).P(@x.Px)$
- **□** And:  $\wedge = \lambda t_1 t_2$ .  $\forall t. (t_1 \Rightarrow t_2 \Rightarrow t) \Rightarrow t$
- **Or**:  $\forall = \lambda t_1 t_2$ .  $\forall t. (t_1 \Rightarrow t) \Rightarrow (t_2 \Rightarrow t) \Rightarrow t$
- **False**:  $F = (\forall (t : bool) . t)$
- $\square$  Not:  $\neg = (\lambda t. t \Rightarrow F)$
- **Exists unique**:  $?! = (\lambda P.(\exists x.Px) \land (\forall xy.Px \land Py \Rightarrow (x = y)))$



# The theory INIT (part of bool)

The first three axioms (4 in total) in HOL's **Standard Theory**:

- $lue{\Box}$  BOOL\_CASES\_AX:  $\vdash \forall t.(t = \mathtt{T}) \lor (t = \mathtt{F})$
- $\blacksquare$  ETA AX:  $\vdash \forall t.(\lambda x.tx) = t$
- ightharpoonup SELECT\_AX:  $\vdash \forall Px.Px \Rightarrow P(\$@P)$  (or P(@x.Px))

The infinite axiom (and needed definitions):

- $\bullet \quad \mathsf{ONE\_ONE} = (\lambda f. \forall x_1 x_2. f(x_1) = f(x_2) \Rightarrow x_1 = x_2)$
- INFINITY\_AX:  $\vdash \exists f.$ ONE\_ONE  $f \land \neg$ ONTO f

(Example: f(x) = 2x on the set of all natural numbers.)

