

# **Foundations for the Management of Formal Mathematical Knowledge**

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## Vision

Very large libraries (databases) of formal mathematical knowledge, created and shared by the theorem proving community, will make interactive theorem provers indispensable tools in parts of mathematics, science, and education as they already have become in formal methods and software practice. In turn, the libraries will grow more rapidly and become interconnected with the intuitive mathematical literature, weaving threads of computational certainty into the oldest rigorous intellectual activity of human kind.

MetaPRL

NuPRL

Mizar

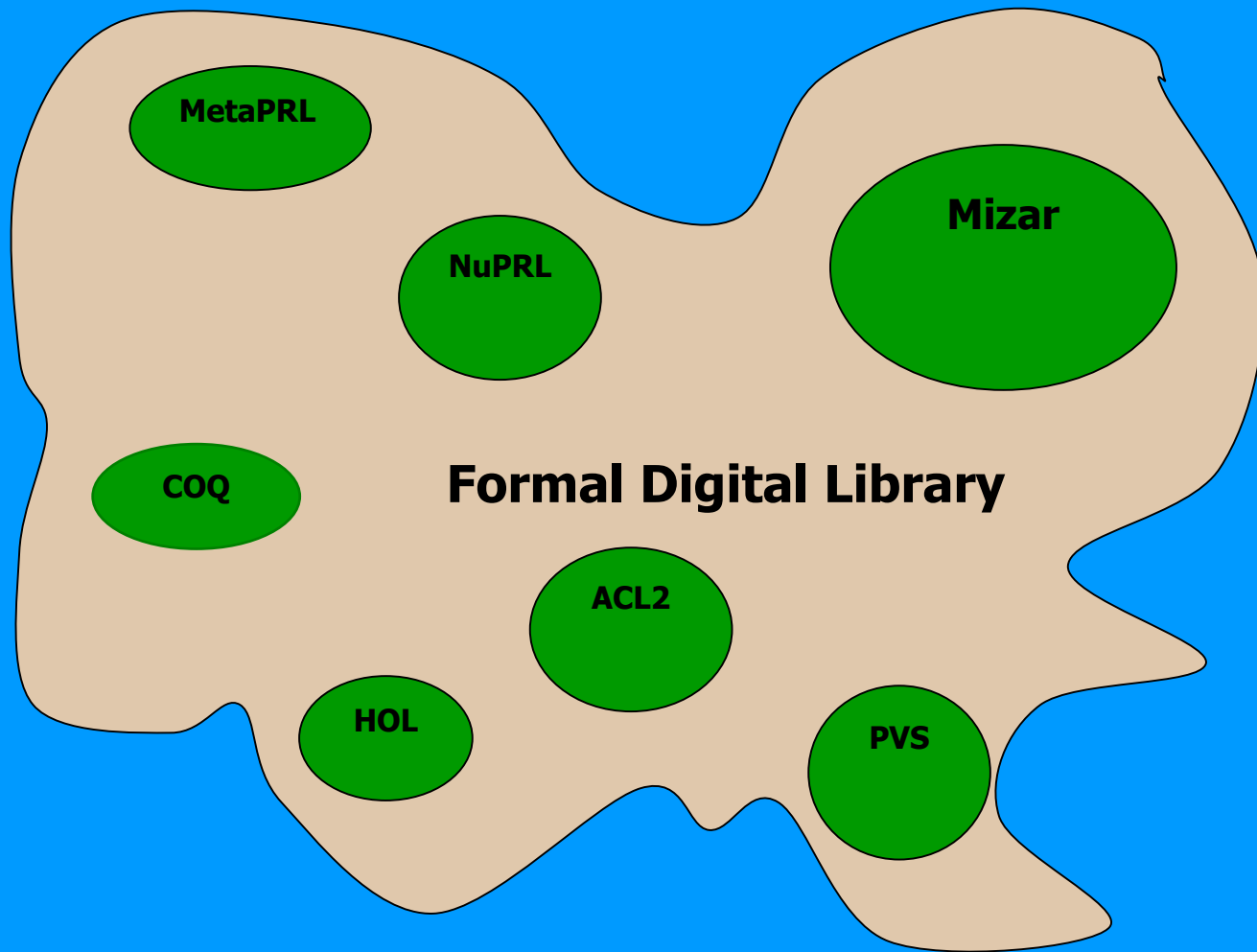
COQ

ACL2

HOL

PVS

Theorem proving systems as **isolated** islands,  
reaching a small community



The FDL joins all the small islands into a single big island that can accommodate much more than the sum of all individual islands, and allows people to stand on the ground in between.

## Challenges and Problems

1. Community using formal proofs is relatively **small**
  - **Market** for formal proofs is small
    - proof technology not widely used in software
    - proof technology not widely used in science and math
    - proof technology not widely used in education
  - Formal proving is still **hard work**
    - expansion factor
    - **shallow base** of basic **mathematical facts**
    - demanding skill set (programming + math + design)

## Challenges and Problems

2. Community is **disconnected**
  - Each group uses a different system
  - Almost no sharing (logical difficulties, practical ones)
  - Systems change or go extinct

# Digital Library Approach to the Challenges

1. **Widen** the community by
  - library will increase the services provided
  - library will decrease the effort to create proofs (seen from experience)
2. **Connect** the community through a common service
  - the digital libraries approach

# Outline

1. Relating theories and systems
2. The structure of theories
3. Aids to organization and search

## Type Theories

There are **at least eleven** active important interactive provers, some coupled to fully automatic provers such as JProver, Otter, TPS, and Omega.

**ACL2, Alf, Coq, HOL, Isabelle, MetaPRL, Minlog, Mizar, Nuprl, PVS, Twelf**

**Nine** of these are based on **higher-order typed logic**. Why?

Will there ever be **ONE** system? ONE logic? ONE framework? ONE metalogic?

Will there ever be one Operating System? One Programming Language?

# Central Characters – Higher-Order Logics and Type Theories

## HOL/Isabel

$\mathbb{N}, \mathbb{B}$

$A \rightarrow B$

$A \times B$

$a = b \text{ in } A$

$\forall x : A, \exists x : A$

## Nuprl

$\mathbb{Z}, \text{Atom}$

$x : A \rightarrow B$

$x : A \times B$

$a = b \text{ in } A$

$\forall x : A, \exists x : A$

Coq and Nuprl share many features, so Coq will be mentioned as well.

# Comparing Representative Type Theories

Least Number Principle (**LNP**):

$$\forall P : \mathbb{N} \rightarrow \mathbb{B}. \left( \exists y : \mathbb{N}. P(y) \Rightarrow \exists x : \mathbb{N}. (P(x) \ \& \ \forall z : \mathbb{N}. z < x \Rightarrow \neg P(z)) \right)$$

Law of Excluded Middle (**LEM**):

$$\forall P : \text{Prop}_i. (P \vee \neg P)$$

## Interpretations of LNP

In Nuprl LNP specifies a class of programs that includes:

```
least (P, y) =  
  for i = 0 to y do  
    if P (i) then return (i)  
    else i := i + 1  
  end; return (y).
```

In HOL and PVS the function  $P \in \mathbb{N} \rightarrow \mathbb{B}$  is **ANY** function, and it represents any propositional function, including noncomputable ones, e.g.:

$P(x, m)$  iff a Turing machine with  $x$  states can print the number  $m$  and halt starting with blank tape.

## Interpretations of LEM

In Nuprl, LEM is not an axiom nor a theorem. There are models of Nuprl for which  $\neg LEM$ , and  $LEM$  is false in the domain theory of Nuprl.

In HOL and PVS, LEM is an axiom.

Adding LEM to Nuprl produces a theory we call **Classical Nuprl**. Doug Howe proved that this theory is consistent.

We will examine that proof.

# Type Theory as a Specification Language

Integer **square root** example

- Thm 1.2  $\forall n : \mathbb{N}. \exists ! r : \mathbb{N}. \text{Root}(n, r)$
- Cor 1.1  $\exists rt : \mathbb{N} \rightarrow \mathbb{N}. \forall n : \mathbb{N}. \text{Root}(n, rt(n))$
- Cor 1.2  $\text{ext}(\text{Thm1.1}) \varepsilon \mathbb{N} \rightarrow \mathbb{N}$
- Cor 1.3  $\forall n : \mathbb{N}. \text{Root}(n, \text{ext}(\text{Thm1.1})(n))$

## Interpretations of Integer Square Root

These theorems could be true in Coq, HOL, Nuprl, and PVS if HOL and PVS supported **extraction of functions** from  $\forall \exists$  statements according to the **Semantics of Evidence**; see my MOD 1982 lecture notes, *Assigning Meaning to Proofs*; and my *Handbook of Proof Theory* article [39], “Types in Logic, Mathematics and Programming.”

In Coq and Nuprl, the function in Cor 1.1 is **computable**.

## The Root Program Extract

The **Working Material**, Appendix A, p. 46, shows the extract term for this proof in ML notation:

```
let rec sqrt i =  
  if i = 0 then < 0, pf0 >  
  else let < r, pfi-1 > = sqrt (i - 1)  
  in if (r + 1)2 ≤ n then < r + 1, pfi >  
  else < r, pfi' >
```

# Relating theories and systems

(early period)

## CLASSICAL

Simple type theory – **STT**  
(HOL, Isabelle)

Extended STT – **STT<sup>+</sup>**  
(PVS)

## CONSTRUCTIVE

Intuitionistic type theory – **ITT**  
(Alf)

Computational type theory – **CTT**  
(Nuprl, MetaPRL)

Calculus of Inductive Constructions – **CIC**  
(Coq, MetaPRL)

# Relating theories and systems

(current period)

## CLASSICAL

Simple type theory – STT  
(HOL, Isabelle)

Extended STT – STT<sup>+</sup>  
(PVS)

Classical – CTT (Howe 1997)

Polymorphic

Computational

includes sets

(Classical – Nuprl)

## CONSTRUCTIVE

Constructive Simple type theory – CSTT  
(Berghofer/Nipkow 2002)

Intuitionistic type theory – ITT

Computational type theory – CTT

Calculus of Inductive Constructions – CIC

## Semantics of STT

Andy Pitts gives a clean semantics of STT in ZF set theory.

In that semantics:

$$\mathbb{N} = \{\emptyset, \{\emptyset\}, \{\emptyset, \{\emptyset\}\}, \dots\}$$

$$\lambda x : N. b(x) = \{\langle x, b(x) \rangle \mid x \in \mathbb{N}\}$$

$\mathbb{N} \rightarrow \mathbb{N}$  is the set of **functional relations** on  $\mathbb{N} \times \mathbb{N}$ .

## Semantics of CTT

Per Martin-Lof provided an intuitive axiomatic semantics based on his doctrine of **canonical forms**.

Stuart Allen gave a PER (partial equivalence relation) semantics in a neutral theory of inductive definitions.

In that semantics:

$\mathbb{Z}$  = all terms that evaluate to canonical integers

$$\{n\}_{\mathbb{Z}} = \{x : \text{Term} \mid x \downarrow n\}$$

$$\mathbb{Z} \text{ is } \bigcup_{z \in \mathbb{Z}} \{z\}_z$$

## Semantics of CTT

$\lambda x.b(x)$  is defined by evaluation rules

think of  $\{3\} \rightarrow \{f3\}$

$\mathbb{Z} \rightarrow \mathbb{Z}$  is  $\bigcup_{f \in \mathbb{Z} \rightarrow \mathbb{Z}} \bigcap_{z: \mathbb{Z}} (\{z\} \rightarrow \{fz\})$

$\lambda X.X$  is in **all**  $A \rightarrow A!$

## Subtyping in CTT versus Set Theory

Notice  $\text{Even} \sqsubseteq \mathbb{N}$

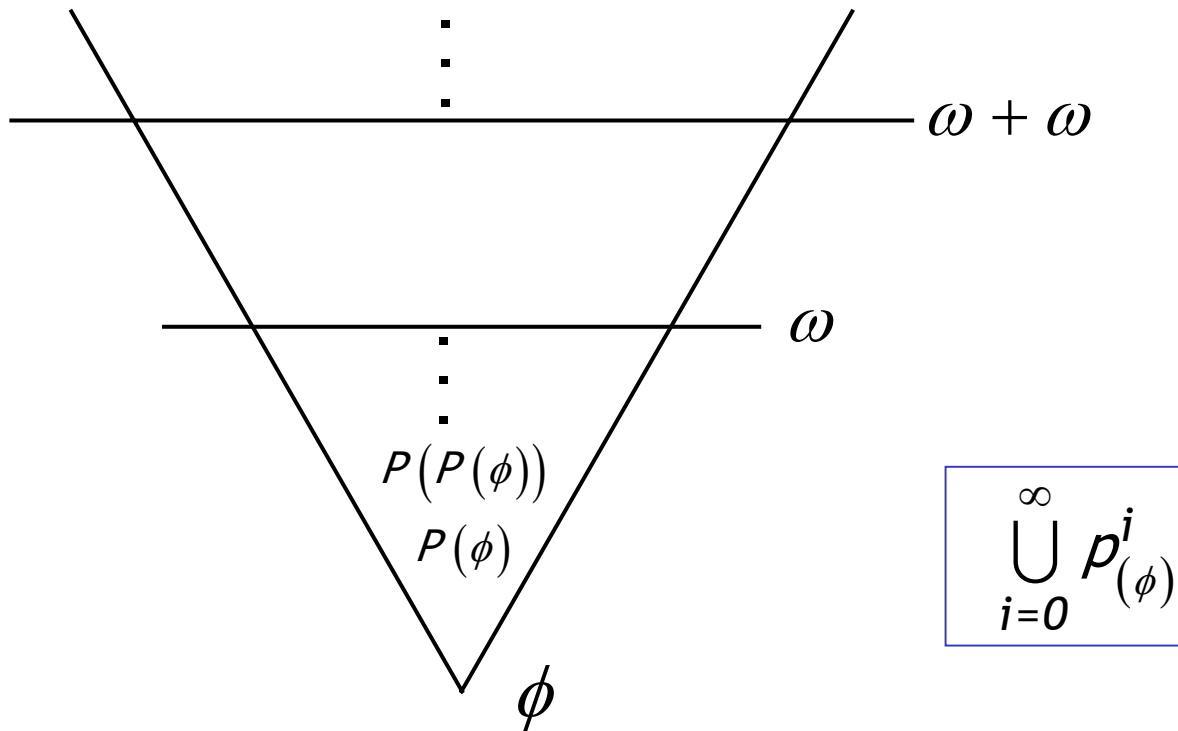
In CTT,  $\mathbb{N} \rightarrow \mathbb{B} \sqsubseteq \text{Even} \rightarrow \mathbb{B}$

consider  $\lambda x.\text{rm}(x,2)$

In Set Theory, any  $f$  in  $\text{Even} \rightarrow \mathbb{B}$

is a subset of a function in  $\mathbb{N} \rightarrow \mathbb{B}$

# The Cumulative Hierarchy of Sets



Captures the intuition of collecting stages and co-finality...  
unending stages.

## Zermelo Fraenkel Set Theory (ZF)

ZF can be axiomatized in 1<sup>st</sup> order logic by axioms, 2 axiom schemas (separation, replacement). Axiom of choice is a 9<sup>th</sup> axiom.

The hierarchy is defined as:

$$\begin{aligned}Z_0 &= \phi \\Z_\alpha &= \bigcup_{\beta < \alpha} Z_\beta \\Z_{\alpha+1} &= P(Z_\alpha) \\Z &= \bigcup_{\alpha \in Ord} Z_\alpha\end{aligned}$$

Every ZF set  $X$  is in some  $Z_\alpha$ ; its rank is the least such ordinal  $\alpha$ .

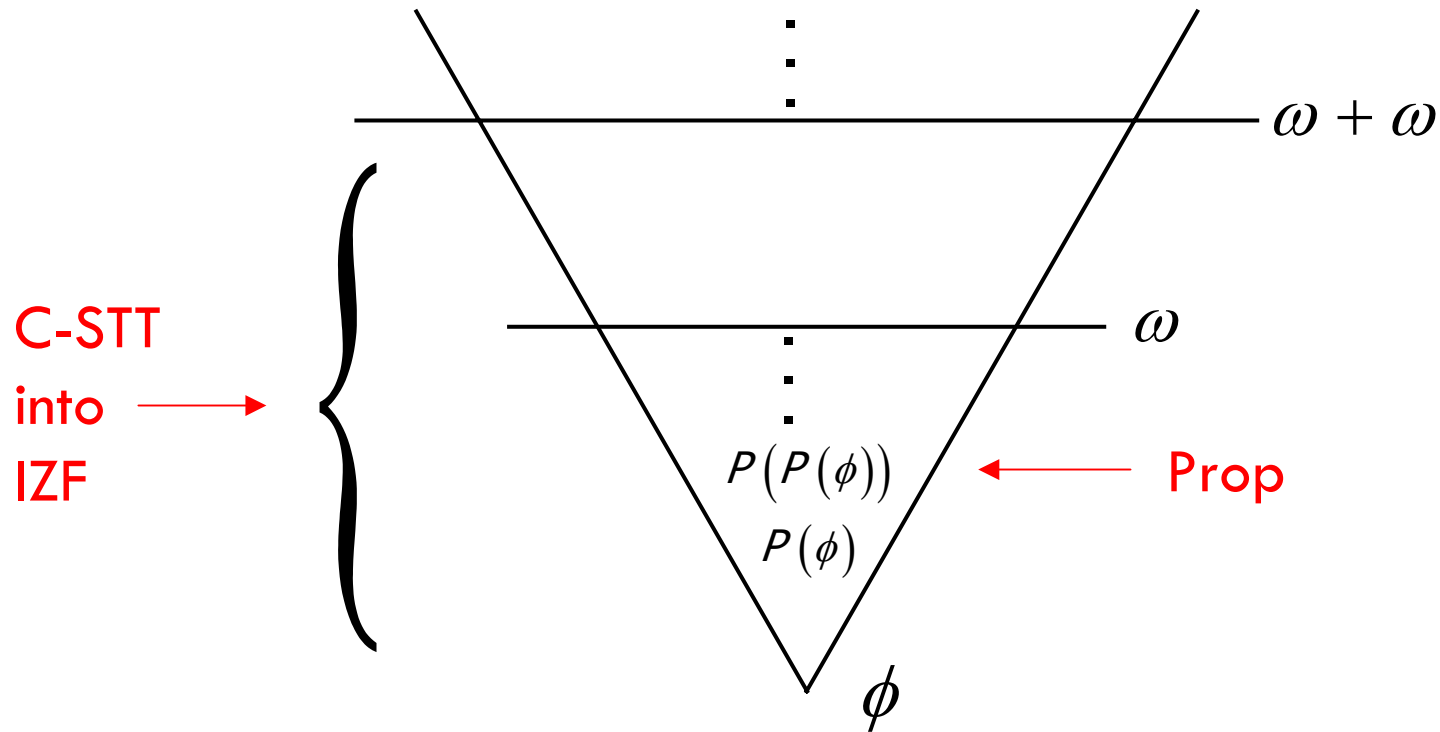
# Semantics for HOL

STT  $\xrightarrow{\text{Pitts}}$  ZC

C-STT  $\xrightarrow{\text{Cornell}}$  CZ

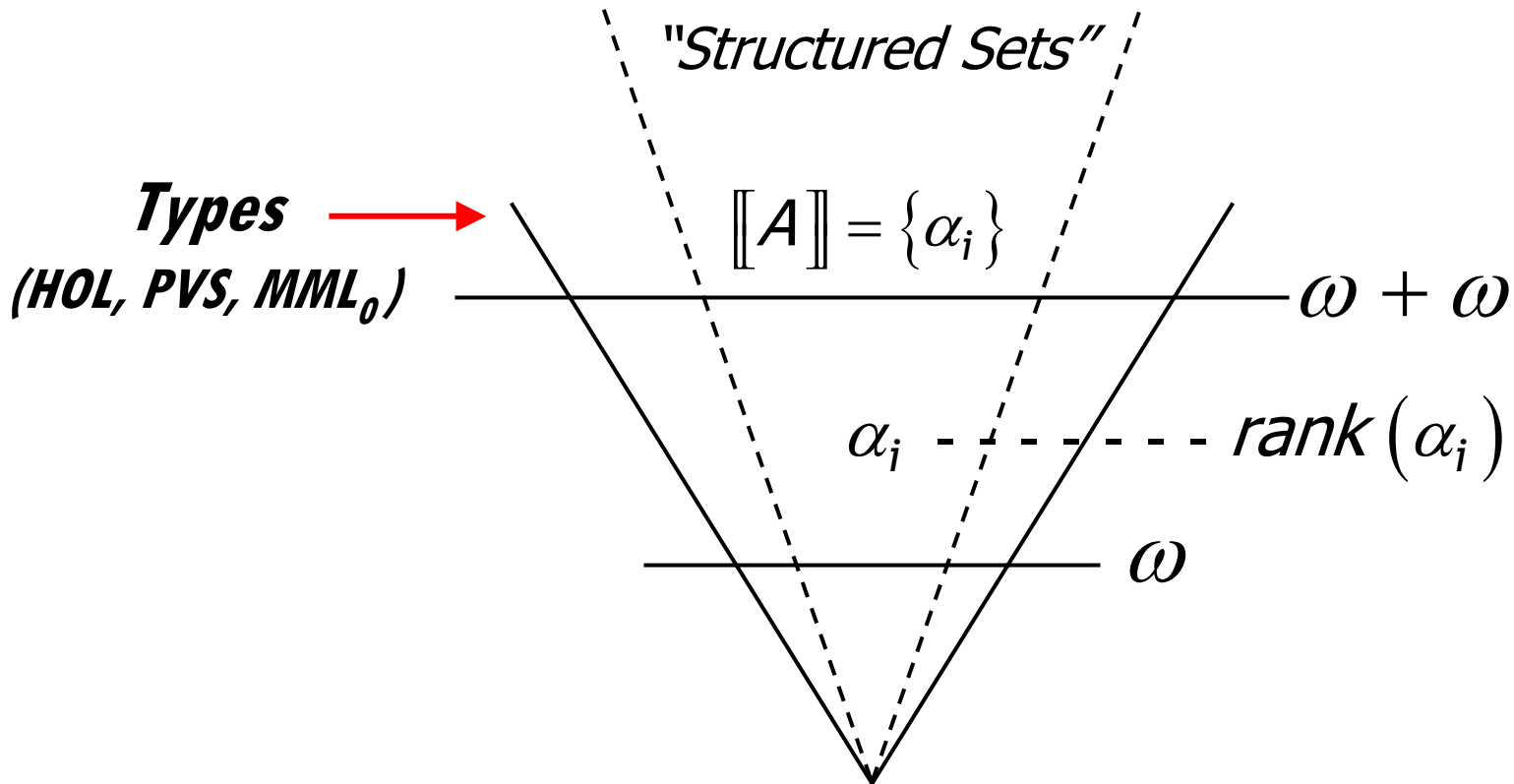
C-STT  $\longrightarrow$  Coq  $\xrightarrow{\text{Werner}}$  ZFC

# An Intuitionistic Cumulative Hierarchy of Sets



First Order Logic (FOL) Base with proof terms (proofs-as-programs.)

# Review of Set Theoretic Semantics



## The Cumulative Hierarchy of Sets

## Goal of Howe's Approach

Pure  
Type Theory

$$\begin{array}{c}
 \boxed{a_1, a_2, \dots, a_i \dots} \\
 f(a) \\
 f \Downarrow \lambda x.b \quad p \Downarrow \langle a, b \rangle \\
 \hline
 \lambda x.b \quad \langle a, b \rangle \quad c_i(\bar{a}) \quad \mathbb{U}_i
 \end{array}$$

enlarge  
↓

Type Theory  
with  
Set Terms

$$\begin{array}{c}
 \boxed{a_1, a_2, \dots, a_i \dots} \quad \boxed{\alpha_1, \alpha_2, \dots, \alpha_i \dots} \\
 A \quad \hat{\gamma}_A \quad f(a) \quad \hat{\varphi}(\hat{\alpha}) \\
 f \Downarrow \lambda x.b \quad f \Downarrow \hat{\varphi} \quad c_i(\bar{\alpha}) \Downarrow c_i(\bar{\alpha}) \\
 \hline
 \lambda x.b \quad a \mapsto b \quad \langle a, b \rangle \quad \langle \hat{\alpha}, \hat{\beta} \rangle \quad c_i(\bar{a}) \quad c_i(\hat{\alpha})
 \end{array}$$

## Howe's Meaning Functions

Howe's Approach to Set-theoretic Semantics:

like Pitts, Dybjer, Troelstra, and others, Doug Howe maps types into sets; for  $A$ , a type,  $\llbracket A \rrbracket$  is a set.

However, he introduces new ideas to handle functionality, **polymorphism**, subtyping, quotient types, and types as objects (universes). For instance,

$\llbracket \lambda X.X \rrbracket_{A \rightarrow A}$  is an element  $\varphi$  of  $\llbracket A \rightarrow A \rrbracket$

and he writes that  $\varphi \triangleleft \lambda X.X.$

## Limitations of Set Embedding

Unlike with PVS and HOL, no embedding can cover all of Nuprl because

- Recursive types allow  $\mathcal{T} = (\mathcal{T} \rightarrow \mathbb{B}) \rightarrow \mathbb{B}$
- Domains all absolutely **unsolvable problems**

But Howe gets a very substantial part and Moran extends to more.

## Goal of Howe's Approach

- **Extend** the family of “structured sets”
- Create **constants** for all “structured sets”
- Extend **evaluation** to all terms
- Define **approximation** (covering)

$$\alpha_i \triangleleft a_i$$

to relate **sets**  $\alpha_i$  to **terms**  $a_i$

## Howe's Method

1. **Encode** type terms and types into sets in the cumulative

hierarchy  $W$

$\langle ty, \gamma \rangle$	$\gamma$
$\langle fn, \varphi \rangle$	$\varphi$
$\langle C_i \langle \alpha_1, \dots, \alpha_n \rangle \rangle$	$C_i(\bar{\alpha})$

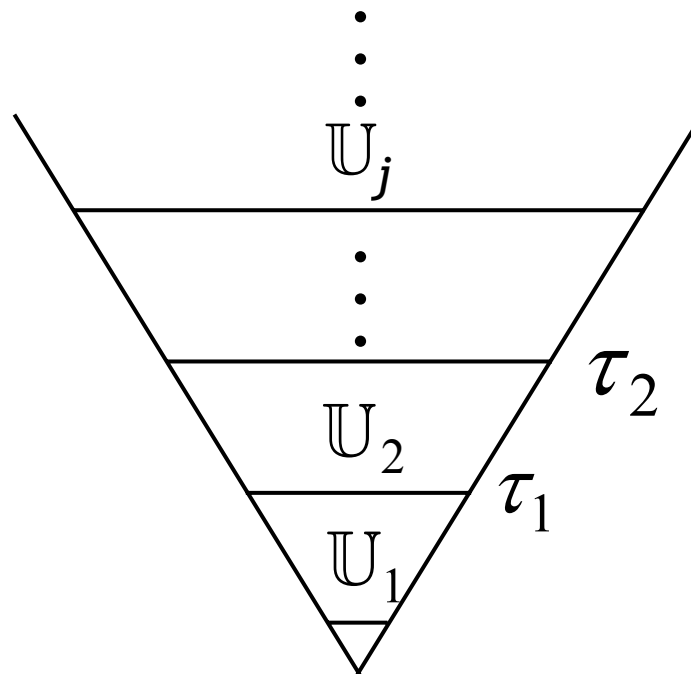
2. Define a subset of  $W$  with a **unique meaning** property; call it  $V$ .
3. Define a **term model** for all  $V$  sets; call it  $T_0$ .
4. Define evaluation and approximation on  $T_0$ ; this provides a computational type theory with **set oracles**.

I present a variant used by Evan Moran to extend Howe's results.

# Extending Set Theoretic Semantics to ML-82, Alf, Nuprl

Can we account for these ideas in set theory?

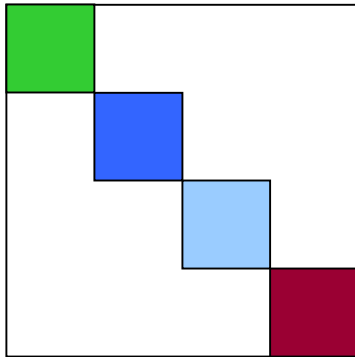
Can we embed CTT into the cumulative hierarchy?



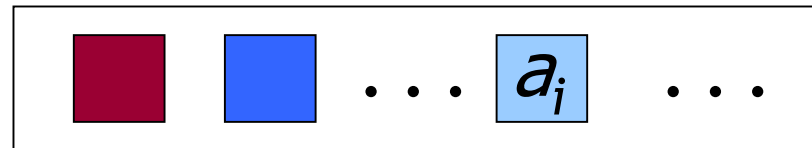
$\tau_i$  are inaccessible  
cardinals

## Howe's Semantics

We think of types as collections of equivalence classes of terms:



or



We need to allow sets representing equivalence classes  $\alpha_i$  into the collection of types.

$$\boxed{\alpha_1, \alpha_2, \dots, \alpha_n} \text{ written } \gamma \{ \alpha_1, \alpha_2, \dots, \alpha_n \}$$

where  $\alpha_i$  covers  $a_i$  ( $\alpha_i$  approximates  $a_i$ )  $\alpha_i \triangleleft a_i$

## Disjointness and Incompatibility

The equivalence classes are **disjoint**, of course.

$$A = \boxed{a_1 \quad a_2 \quad \dots \quad a_i \quad \dots}$$

if  $a_i \cap a_j \neq 0$  then

$$a_i = a_j$$

The set elements must also be **incompatible**:

$$\gamma_A = \{\alpha_1, \alpha_2, \dots, \alpha_i\}$$

$con(\alpha_i, \alpha_j)$  implies  $\alpha_i = \alpha_j$

For each  $a_i \in A$  there will be a **unique**  $\alpha_i \in \gamma_A$ , such that  $\alpha_i \triangleleft a_i$ .

## Disjointness and Incompatibility

The key condition for functions is:

$$\varphi \quad \langle \alpha_1, \beta_1 \rangle, \langle \alpha_2, \beta_2 \rangle, \dots, \langle \alpha_i, \beta_i \rangle, \dots$$

$$\varphi' \quad \langle \alpha'_1, \beta'_1 \rangle, \langle \alpha'_2, \beta'_2 \rangle, \dots, \langle \alpha'_i, \beta'_i \rangle, \dots$$

If for all  $\langle \alpha, \beta \rangle, \langle \alpha', \beta' \rangle$   
 $con(\alpha_i, \alpha'_i)$  implies  $con(\beta_i, \beta'_i)$

then

$$con(\varphi, \varphi')$$

## Compatibility (Consistency) Examples

- $0 \mapsto 0$  and  $1 \mapsto 1$  are **compatible** (consistent) since  $\varphi\{< 0, 0 >\}$  and  $\varphi\{< 1, 1 >\}$  have a non-empty intersection,  $\varphi\{< 0, 0 >, < 1, 1 >\}$ .
- $0 \mapsto (0 \mapsto 0)$  and  $0 \mapsto (1 \mapsto 1)$  are **compatible**,  
i.e.  $\varphi\{< 0, \varphi\{< 0, 0 >\} >\}$  **con**  $\varphi\{< 0, \varphi\{< 1, 1 >\} >\}$   
since  $0$  **con**  $0$  and  $\varphi\{< 0, 0 >\}$  **con**  $\varphi\{< 1, 1 >\}$ .

## Membership and Approximation

If the type  $A$  is interpreted as the set  $\gamma_A$ , then for each  $a \in A$ , there is a unique  $\alpha$  such that

$$\alpha \triangleleft a.$$

We will say  $\llbracket A \rrbracket = \gamma_A$  and  $\llbracket a \rrbracket_A = \alpha$ .

## Uniqueness Theorem

For any term  $t$  in  $T_0$ ,

1. If  $\gamma_1 \triangleleft t$  and  $\gamma_2 \triangleleft t$ , then  $\gamma_1 = \gamma_2$
2. For all  $\gamma \in V$  and  $\alpha_1, \alpha_2 \in \gamma$ ,  
if  $\alpha_1 \triangleleft t$  and  $\alpha_2 \triangleleft t$ , then  $\alpha_1 = \alpha_2$

## The Term Language $\mathcal{T}_0$

Howe defines a term language,  $\mathcal{T}_0$ , that includes the Nuprl terms with binding, such as

$$x : A \rightarrow B, x : A \times B, \lambda x.b, x : A \cap B, \\ \text{less}(n; m; a; b), \text{decide}(p; x.a; y.b), \dots$$

$\mathcal{T}_0$  includes the constructors and constants, such as

$$\mathbb{U}_i, \text{nat}\{n\}, \text{pair}(a; b), \text{inl}(a), \text{inr}(b), \text{ap}(f; a), \dots$$

$\mathcal{T}_0$  includes constants for all of the  $\gamma, \varphi, \xi, c_i(\bar{\alpha})$  sets.  
Howe uses  $\hat{\gamma}, \hat{\varphi}, \hat{\xi}$  to denote the set terms.

## The Term Language $\mathcal{T}_0$

Howe extends the evaluation relation to all terms,  
for example:

$$\begin{aligned} ap(\lambda x.b; a) \Downarrow c & \text{ if } b[a/x] \Downarrow c \\ less(0; 1; a; b) \Downarrow c & \text{ if } a \Downarrow c \end{aligned}$$

For instance,  $ap(\lambda x.x; \hat{\varphi}) \Downarrow \hat{\varphi}$ .

## Evaluation Rules

$$\frac{f \Downarrow \hat{\phi} \quad (\alpha, \beta) \in \phi \quad \alpha \triangleleft a}{f(a) \Downarrow \hat{\beta}} \quad (ap_{\phi}) \quad \frac{f \Downarrow \lambda x.b \quad b[a/x] \Downarrow v}{f(a) \Downarrow v} \quad (ap_{\lambda})$$

$$\overline{\hat{\gamma} \Downarrow \hat{\gamma}}$$

$$\overline{\lambda x.b \Downarrow \lambda x.b}$$

$$\overline{c_i(\bar{a}) \Downarrow c_i(\bar{a})}$$

## Approximation Rules

$$\frac{e \Downarrow v \quad \alpha \triangleleft v}{\alpha \triangleleft e} \quad \frac{\forall j \quad \alpha_j \triangleleft a_j}{c_i(\hat{\alpha}_1, \dots, \hat{\alpha}_n) \triangleleft c_i(\hat{a}_1, \dots, \hat{a}_n)}$$

$$\frac{\forall (\alpha, \beta) \in \phi \quad \beta \triangleleft b[\hat{\alpha} / x]^\dagger}{\phi \triangleleft \lambda x. b}$$

† Howe does not use this rule because it is unproven when the **non-determinism** of functions on quotient types is allowed.

## Examples

$$\text{Let } \varphi = \{ \langle 0, 4 \rangle, \langle 1, 5 \rangle \} \quad \varphi' = \{ \langle 0, 2 \rangle \}$$
$$\psi = \{ \langle \varphi, 17 \rangle, \langle \varphi', 18 \rangle \}$$

$$\hat{\varphi}(0 + 0) \Downarrow 4 \quad \text{because } 0 \triangleleft 0 + 0$$

$$\hat{\varphi} \triangleleft \lambda x.x + 4 \quad \text{but not } \hat{\varphi}' \triangleleft \lambda x.x + 4$$

$$\hat{\psi}(\lambda x.x + 4) \Downarrow 17$$

## The Substitution Lemma

If  $\alpha \triangleleft a$  then for any term  $e$ ,  
 $\beta \triangleleft e[\alpha / x]$  implies  $\beta \triangleleft e[a / x]$

The intuition is that for any demonstration of  $\beta \triangleleft e[\alpha / x]$ , if it does not examine  $\alpha$ , then it also establishes  $\beta \triangleleft e[a / x]$ .

If the derivation depends on  $\alpha$ , then since  $\alpha \triangleleft a$  and  $a$  is a term, there is more information in  $a$  than in any approximation  $\alpha$ , and that information will establish the facts used about  $\alpha$  to show  $\beta \triangleleft e[\alpha / x]$  using  $a$  in place of  $\alpha$ .

## Rationale for the Substitution Lemma

Assume  $\alpha \triangleleft a$  and  $\beta \triangleleft e[\hat{\alpha}/x]$

To say  $\beta \triangleleft e[\hat{\alpha}/x]$  means  $\alpha \mapsto \beta \triangleleft \lambda x.e$ .

Thus,  $\lambda x.e \in \gamma\{\alpha \mapsto \beta\}$ , a **singleton set**, and

$$(1) \quad \lambda x.e \in \gamma\{\alpha\} \rightarrow \gamma\{\beta\}$$

$$(2) \quad \text{From } \alpha \triangleleft a \text{ we know } a \in \gamma\{\alpha\}$$

From (1) and (2) we have  $(\lambda x.e)a \in \gamma\{\beta\}$ ,

thus,  $e[a/x] \in \gamma\{\beta\}$ , and hence

$$\beta \triangleleft e[a/x].$$

## Soundness – the Meaning of $x : A \rightarrow B$

$\llbracket x : A \rightarrow B \rrbracket$  is the set of functions  $\varphi$  with domain  $\llbracket A \rrbracket$  such that for all  $\langle \alpha, \beta \rangle \in \varphi$ ,  
 $\beta \in \llbracket B [\alpha / x] \rrbracket = \gamma_\alpha$ .

## Soundness of Function Elimination – Conclusion

We need to know that  $\llbracket f(a) \rrbracket_{B[a/x]}$  is defined, i.e.

there is a  $\beta$  in  $\llbracket B[a/x] \rrbracket$

$$\beta \triangleleft \llbracket f(a) \rrbracket.$$

We know that for any  $\langle \alpha, \beta \rangle \in \varphi_f$ ,  $\beta \in \llbracket B[\hat{\alpha}/x] \rrbracket$ ,

by the premise for  $f$ .

To say  $\llbracket a \rrbracket_A = \alpha$  means  $\alpha \triangleleft a$ . (Recall "Membership and Approximation.")

## Soundness of Function Elimination – Conclusion

By the **Substitution Lemma**,

if  $\gamma \triangleleft B [\hat{\alpha} / x]$ , then  $\gamma_{\alpha} \triangleleft B [a / x]$ ,

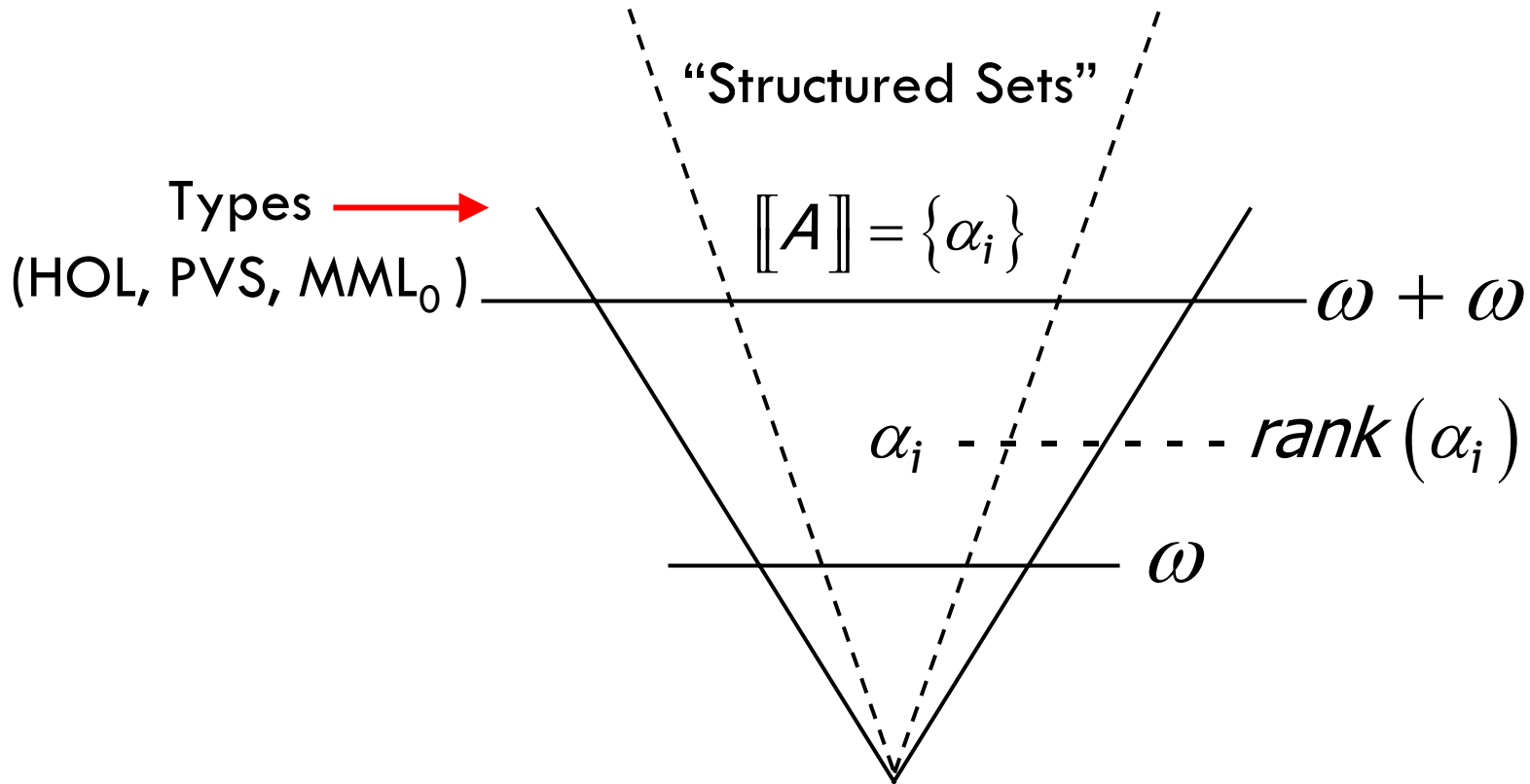
thus,  $\gamma = \llbracket B [\hat{\alpha} / x] \rrbracket = \llbracket B [a / x] \rrbracket$ .

Likewise, if  $\beta \triangleleft f (\hat{\alpha})$  then  $\beta \triangleleft f (a)$ .

But **by the Substitution Lemma**, we know  $\beta \triangleleft f (\hat{\alpha})$ ,  
since  $\varphi_f \triangleleft f$  and  $\beta \triangleleft \varphi_f (\hat{\alpha})$ .

Hence  $\llbracket f (a) \rrbracket_{B[a/x]} \in \llbracket B [a / x] \rrbracket$  as required.

# Review of Set Theoretic Semantics



Cumulative Hierarchy of Sets

## Issues with Nuprl Type Theories

Some Nuprl theorems contradict classical set theory and classical logic.

(a) Nuprl can solve this recursion equation on types:

$$T = (T \rightarrow \mathbb{B}) \rightarrow \mathbb{B}$$

using  $\mu X. (X \rightarrow \mathbb{B}) \rightarrow \mathbb{B}$ .

(b) Nuprl's **domain theory** (bar types) includes this result:

$$\neg \exists h : \bar{\mathbb{N}} \rightarrow \mathbb{B}. \forall x : \bar{\mathbb{N}}. (h(x) = t \text{ iff } x \downarrow)$$

## Nuprl has Union and Intersection

The types  $A \cup B$ ,  $\bigcup_{x \in A} B_x$ ,  $A \cap B$ ,  $\bigcap_{x \in A} B_x$ ,  $x : A \cap B$

all violate Howe's construction as outlined.

$$\left( \{0\} \rightarrow \{0\} \right) \cup \left( \{1\} \rightarrow \{1\} \right)$$

includes  $0 \mapsto 0$  and  $1 \mapsto 1$  but no

$$\alpha \mapsto \beta$$

can approximate both.

# Outline

1. Relating theories and systems
2. The structure of theories
3. Aids to organization and search

## Theory Structure

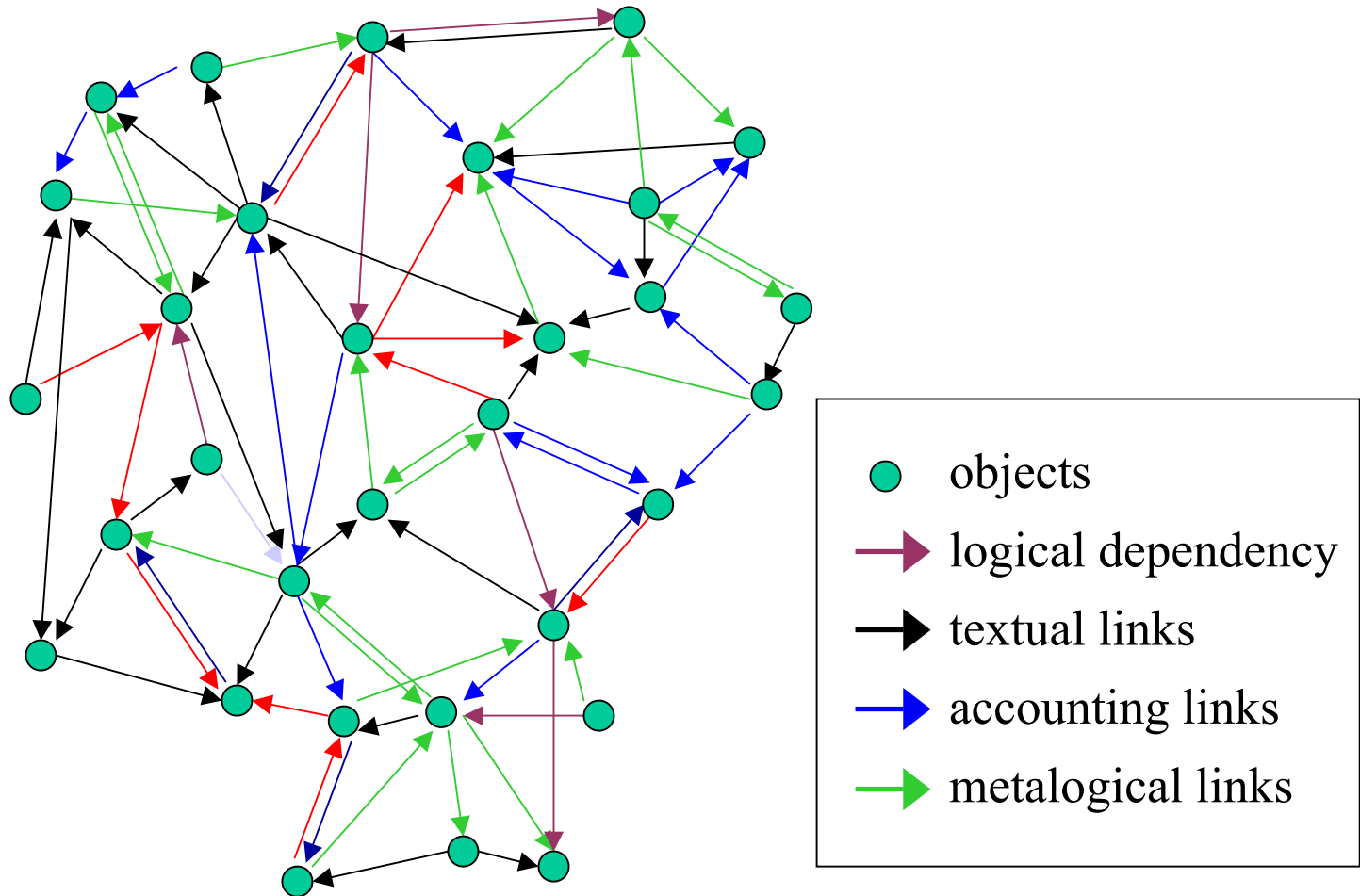
Should theories be directory-like structures, as in Automath contexts (a tree of knowledge)?

These can be internalized as **dependent records**.

$$\{G:\text{Type}, \text{op}:G \times G \rightarrow G; \text{id}:G, \text{ax1}: \text{Assoc}(G, \text{op}); \\ \text{ax2}: \text{Identity}(G, \text{op}, \text{id}); \dots\}$$

The FDL takes a different approach, more like a database than a file system.

# Information Graph of the FDL



# FDL contains **formal** objects

rules

definitions

algorithms, code

conjectures

specifications

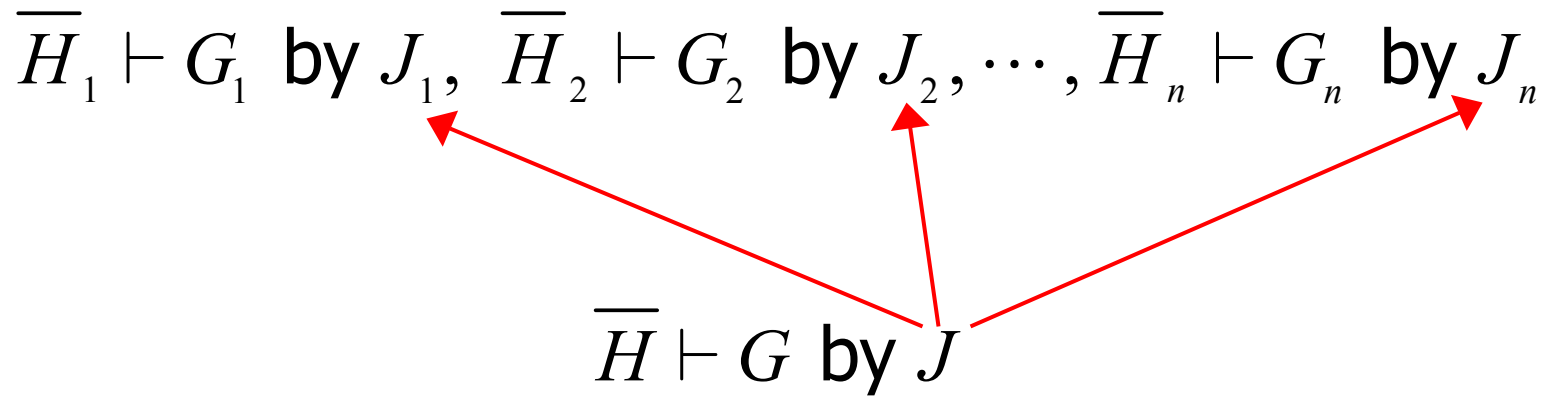
theorems

inferences

proofs, partial proofs

certificates

## Inferences



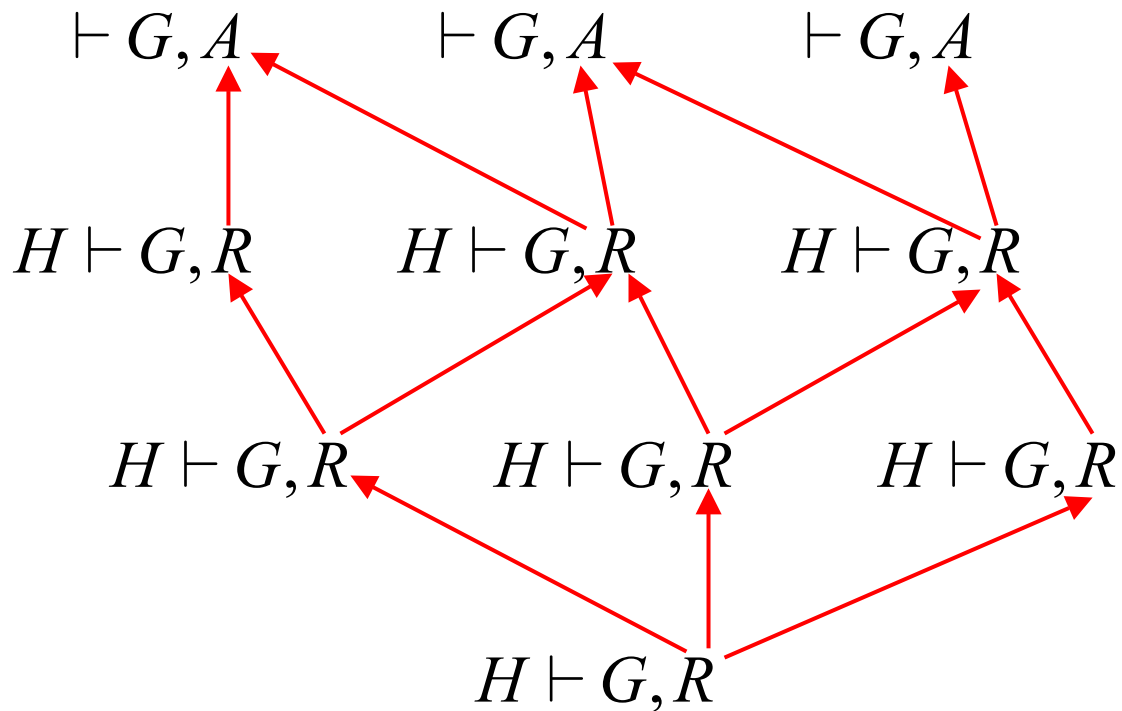
$\overline{H}_i$  a list of formulas (terms)

$G_i$  a formula (term)

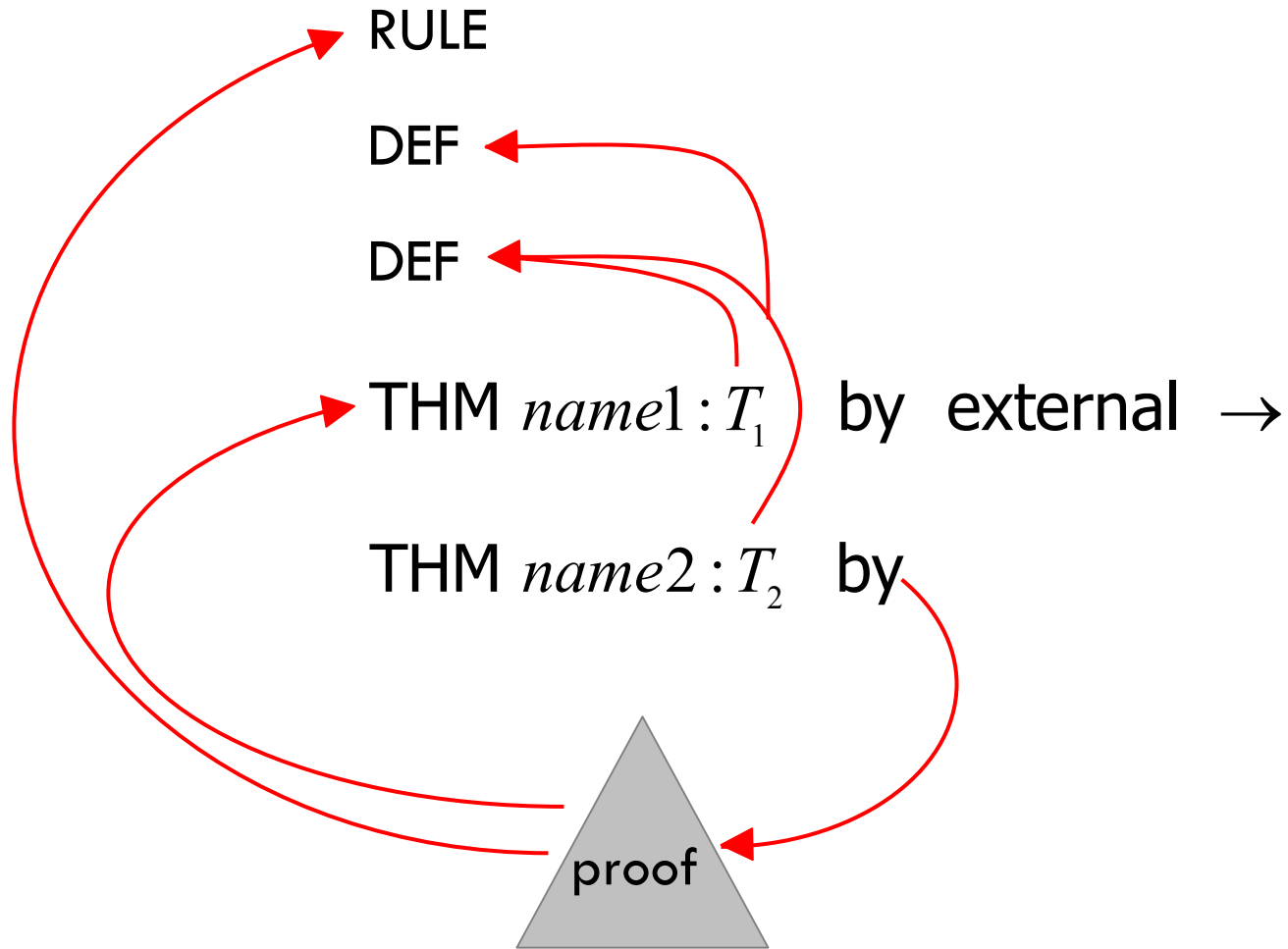
$J_i$  a justification (rule, tactic)

# Proof

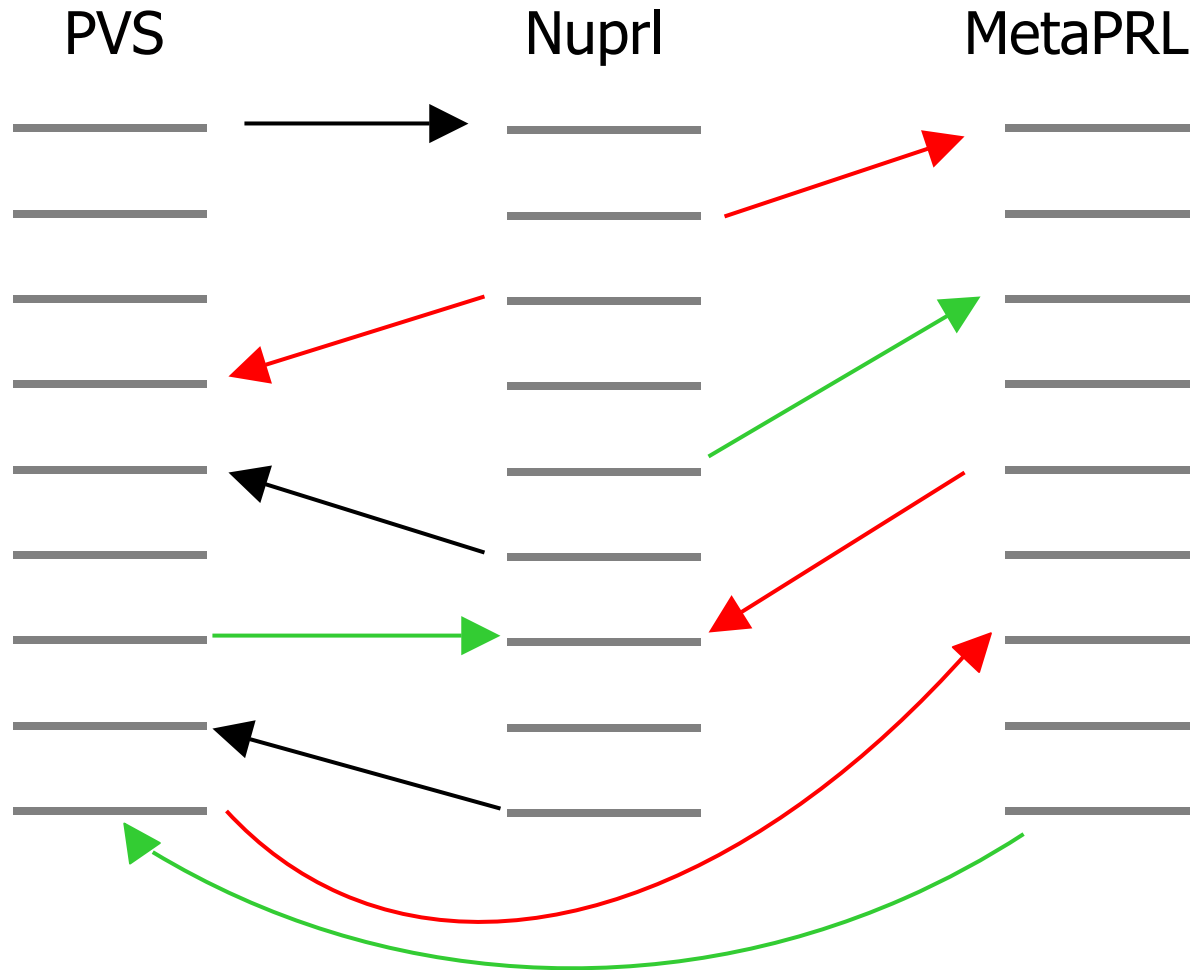
A proof is a dag of inferences



## Example of Dependencies



# FDL allows **sharing** among collections



## FDL performs archival functions

Automath system **Auto QE** checked the following formalization of Landau's Grundlagen (August 17, 2004).

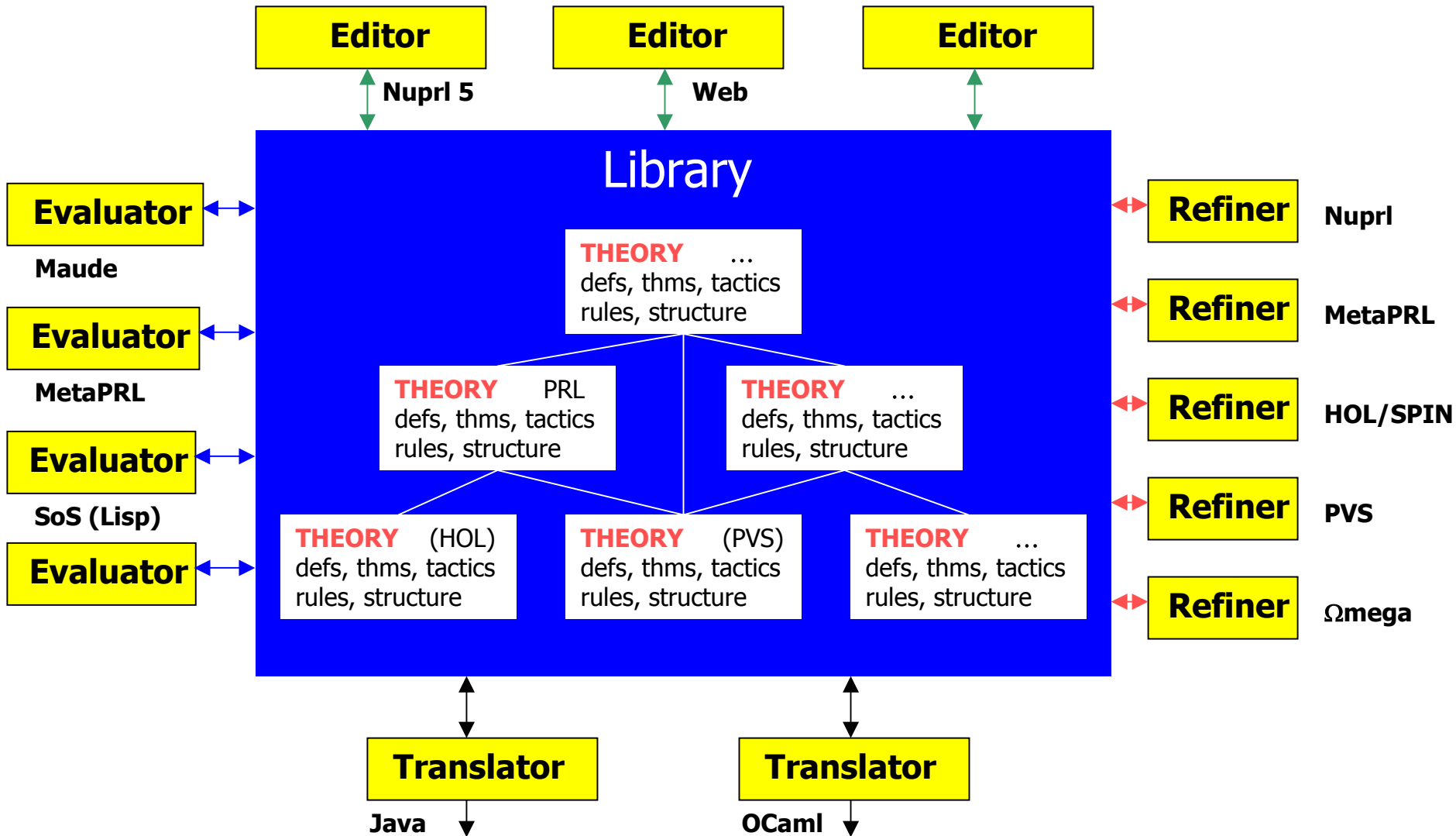
Coq 5.0 created the following extract for the **Fundamental Theorem of Algebra** (June 14, 2003).

Nuprl 5 checked that Total Order (TO) protocol satisfies P (June 5, 2003).

MetaPRL compiler produced C code from TO, and P is preserved (October 19, 2003).

**PVS 2.4** proved Menger's theorem (September 15, 2003).

# Formal Digital Library



## Prototype FDL – Data (Manual 3.1)

Organized to eventually support **closed maps**

$$D \rightarrow Term(D)$$

$D$  are object names (abstract)

$Term(D)$  are objects with embedded references

Map is **closed** under object reference.

Working space is the **current closed map**.

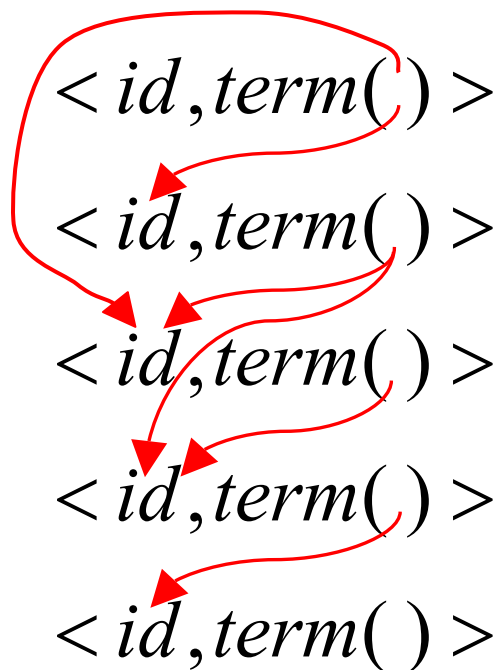
Basic data structure is the **library table**.

## Closed Maps

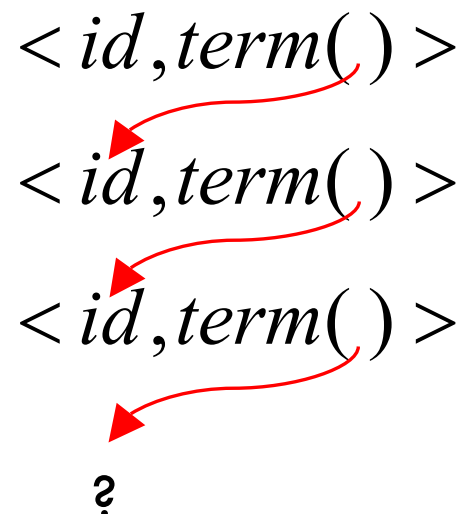
$D \rightarrow Term(D)$

closed under reference (no dangling pointers)

**closed**



**open**



## Abstract Object Identifiers

$$D \cong D'$$

implies

$$\text{Term}(D) \equiv \text{Term}(D')$$

i.e.  $d \leftrightarrow d'$  implies

$$\text{def}(d) = \text{def}(d')$$

$$\text{thm}(d) = \text{thm}(d')$$

$$\text{pf}(\text{thm}(d)) = \text{pf}(\text{thm}(d'))$$

## Concepts for FDL Design

- FDL supports **large-scale operations** on collections

theory translation, e.g. CZF to Type Theory

cross linking via **formal thesaurus**

**transplanting** theorems

classical to constructive **translations**

## Concepts for FDL Design

- FDL provides an experimental publication medium

Can solicit **exemplary contributions**

hybrid articles – formal and informal

elegant formalizations

challenging formalizations

expository articles

hypothetical formalizations

Articles **directly include** shared material

# Outline

1. Relating theories and systems
2. The structure of theories
3. Aids to organization and search

## Objective

- Organize digital formal math by **automated** and **adaptable** means
- Exploratory analysis of formal structure

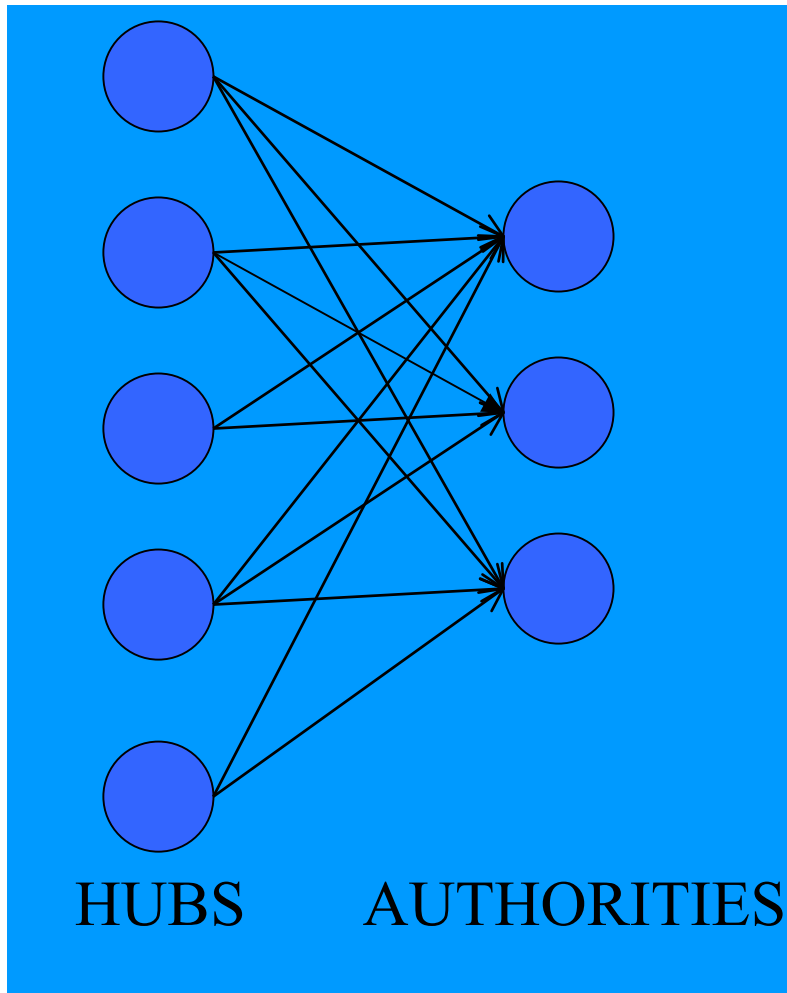
## Motivation

- Collections are growing large; need for better automation, search, visualization, personalization <very broad>
- Can we exploit it in the same way as is done with the structure of the web?
- Formal Mathematics is rich with structure; can we exploit this as some kind of metadata?

## Method

- Graph-based approach to exploit meta-information from the structure
  - relationships between theories are hidden, mass of objects, ordered by humans
- Internet search engines seems really smart; they exploit structure
  - Rank results according to “authority,” Google’s Page Rank
  - Teoma ([www.teoma.com](http://www.teoma.com)) allows you to “refine” search based on clusters
- *Equate hyperlinks with dependencies, use “HITS”*

# Kleinberg's "HITS" Algorithm



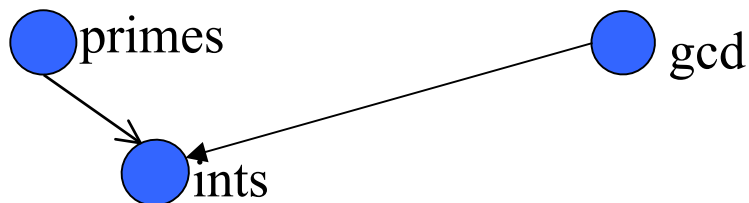
- *Hubs* point to good *authorities* & *authorities* point to good *hubs*
- Sparse adjacency matrix,  $A$ 
  - Hub vector = 1<sup>st</sup> eigenvector of  $AA^T$
  - Authority vector = 1<sup>st</sup> eigenvector of  $A^T A$
- Communities
  - Strongest hubs and authorities from respective non-principle eigenvectors
  - Currently there are improved techniques relying on the same graph

## Iterative Algorithm



- Define  $x^{<n>}$ ,  $y^{<n>}$  authority, hub weight for node  $n$  in graph  $G$  with edges  $E$ .
- $x^{<n>} \leftarrow \sum_{q:(q,n) \in E} y^{<q>}$
- $y^{<n>} \leftarrow \sum_{q:(n,q) \in E} x^{<q>}$
- Iterate  $\sim 20$  times, normalizing after each.

## Design Decisions

- What are analogous to hubs and authorities in formal math?
- Dependency Graphs
  - Theorems and Definitions (Rules, Tactics?)
  - Definitions have no (logical) dependencies
- Direct Forward Dependencies
- Control over size and components of Graph, “Seeding”



## Graph Statistics

- Nuprl5 Standard & Num Thy Subset 
- Bickford's Event Systems 

Nodes	Thm	Def	Max Outlinks	Max Inlinks	Edges	Assortativity
<b>811</b>	<b>646</b>	<b>165</b>	<b>58</b>	<b>637</b>	<b>8765</b>	<b>-0.2949</b>
<b>328</b>	<b>260</b>	<b>68</b>	<b>56</b>	<b>257</b>	<b>3397</b>	<b>-0.2848</b>
<b>1795</b>	<b>1306</b>	<b>489</b>	<b>210</b>	<b>708</b>	<b>16648</b>	<b>-0.15896</b>

# Nuprl5 Number Theory



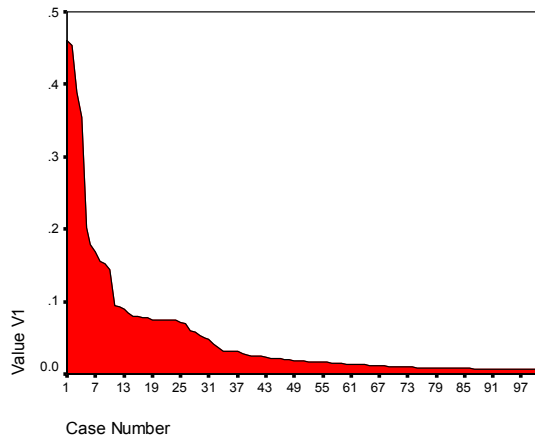
## Standard and Numthy Communities

1	listify_length, select_listify_id, int_seg_ind, select_append_front, decidable__ex_int_seg, or, decidable, so_apply1
2	fincr_formation, fincr_wf, fincr_wf2, equiv_rel_functionality_wrt_iff
3	fib_coprime, gcd_sat_gcd_p, gcd_sat_pred, fib_wf, gcd_wf ycomb, not_wf
4	atomic_char, assert_of_eq_int, prime_elim, assert_of_eq_atom, le_wf

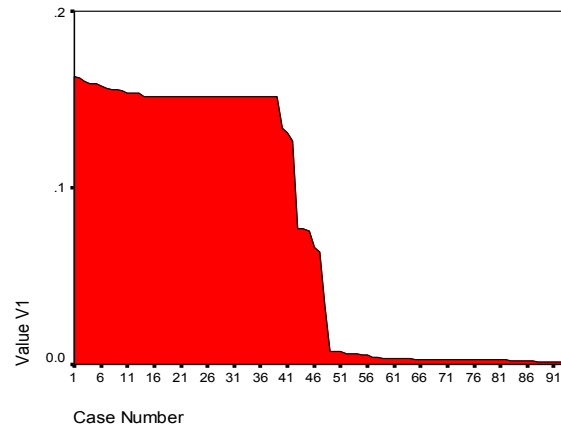
1	divides_of_absvals, absval_assoced, absval_wf
2	chrem_exists_aux_a, gcd_ex_n, chrem_exists_aux, atomic_char, prime_elim, gcd_exists_n, bezout_ident_n, chrem_exists
3	div_3_to_1, div_2_to_1, div_4_to_1, divide_wf, nequal
4	eqff_to_assert, eqtt_to_assert, assert_of_bnot, assert_of_band, prop

# Weight Distributions Nuprl5

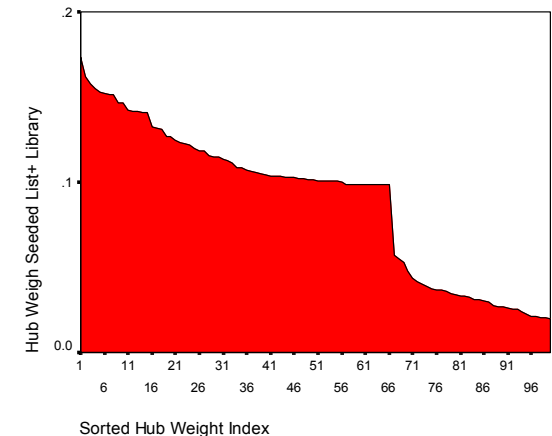
## AUTHORITIES



## HUBS



## HUBS\*

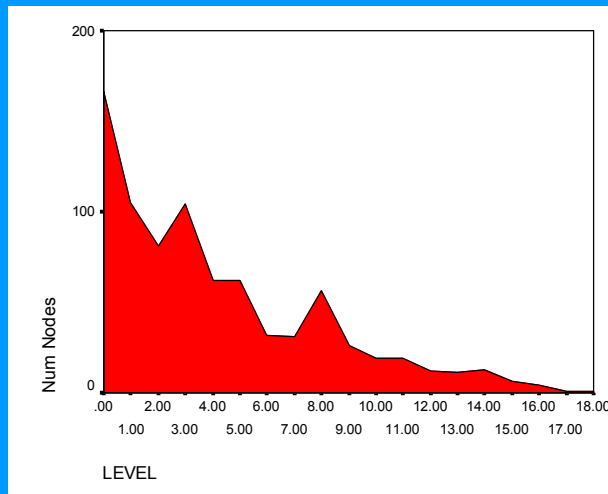


- Step-like Weight Distributions
  - Booleans, lower plateau on authority graph
  - Stratified development of hubs, Bickford's extended list theory

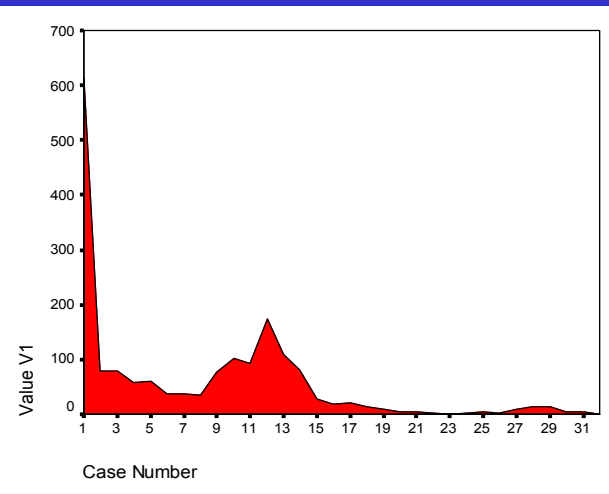
## Level Distribution

- Def: A node,  $n$ , is in level,  $i$ , iff  $n$  depends only on nodes in levels  $< i$ , and  $i$  is the smallest value for which this is the case.
- Characteristic peaks found, suggest characteristic size/complexity of proofs

NUPRL5



EVENT SYSTEMS



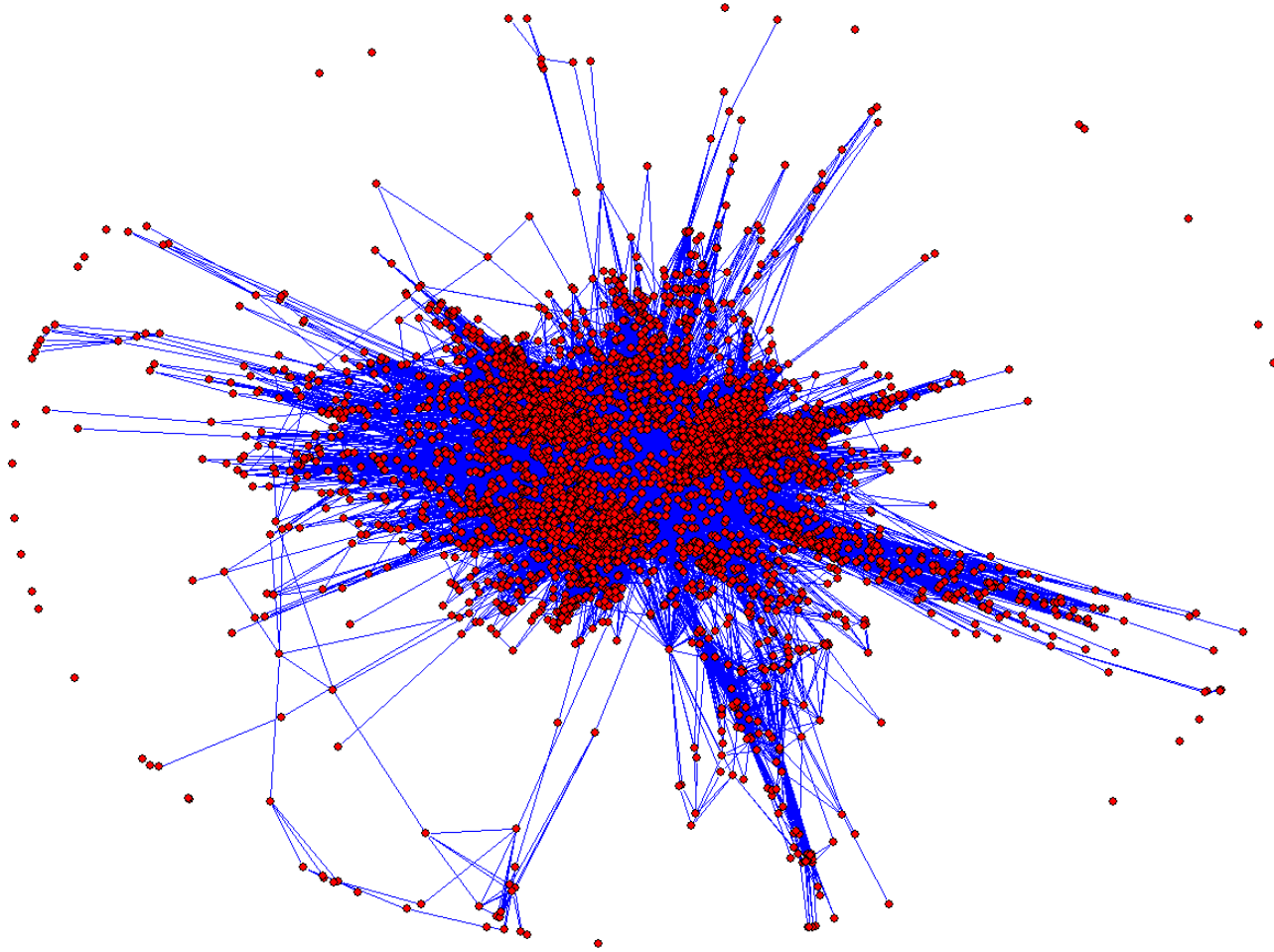
## HELM Coq Library Comparison

- Nuprl5  Event Systems 
- Coq in HELM 

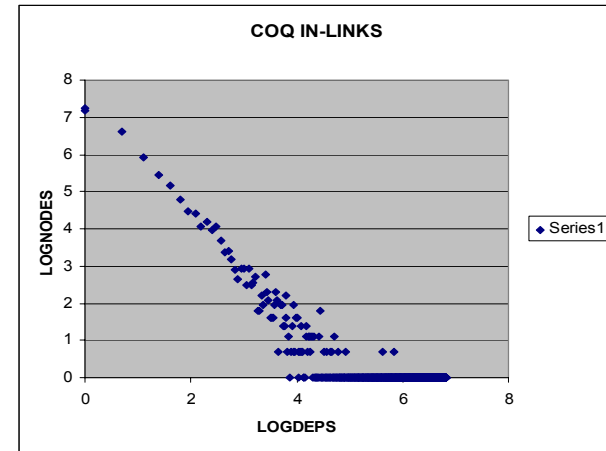
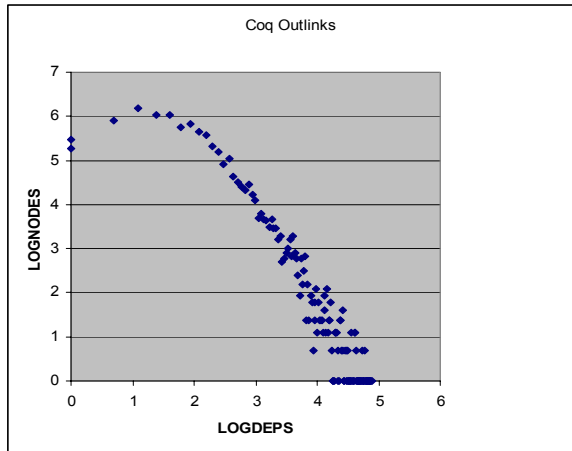
Nodes	Thm	Def	Max Outlinks	Max Inlinks	Edges	Assortativity
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<b>1795</b>	<b>1306</b>	<b>489</b>	<b>210</b>	<b>708</b>	<b>16648</b>	<b>-0.15896</b>
<b>5346</b>	<b>5170</b>	<b>176</b>	<b>132</b>	<b>3093</b>	<b>63093</b>	<b>-0.1884</b>

132 was /Coq/Reals/RiemannInt/RiemannInt\_P28

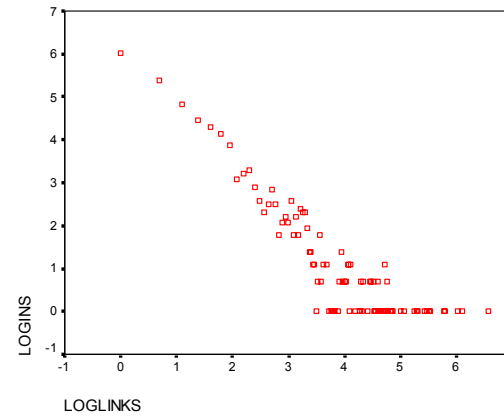
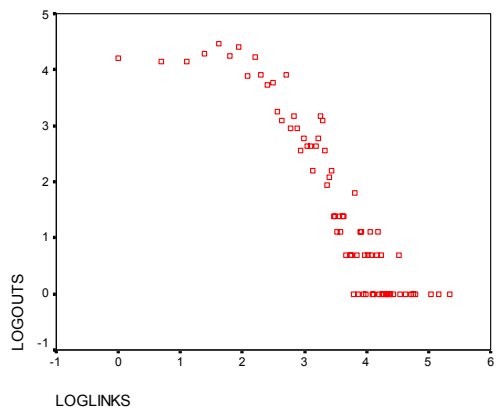
# Coq Graph



# Coq Link Analysis



- Similar link distribution pattern



## Coq HITS

<b>AUTHORITIES</b>	<b>"HUBS"</b>
<p><b>/Init/Logic/eq.ind</b> <b>/Init/Logic/eq_ind</b> <b>/Reals/Rdefinitions/R</b> <b>/Init/Logic/eq_ind_r</b> <b>/Reals/Rdefinitions/R0</b> <b>/Init/Datatypes/bool.ind</b> <b>/Reals/Rdefinitions/Rplus</b> <b>/Reals/Rdefinitions/R1</b> <b>/Reals/Rdefinitions/Rmult</b></p>	<p><b>/Reals/Rtrigo_alt/cos_bound</b> <b>/Reals/SeqProp/</b> <b>cv_speed_pow_fact</b> <b>/Reals/RiemannInt/</b> <b>RiemannInt_P12</b> <b>RiemannInt_P6</b> <b>RiemannInt_P28</b> <b>/Reals/Rtopology/Heine</b> <b>/Reals/Alembert/Alembert_C2</b> <b>/Reals/RiemannInt/</b> <b>RiemannInt_P25</b> <b>RiemannInt_P8</b></p>

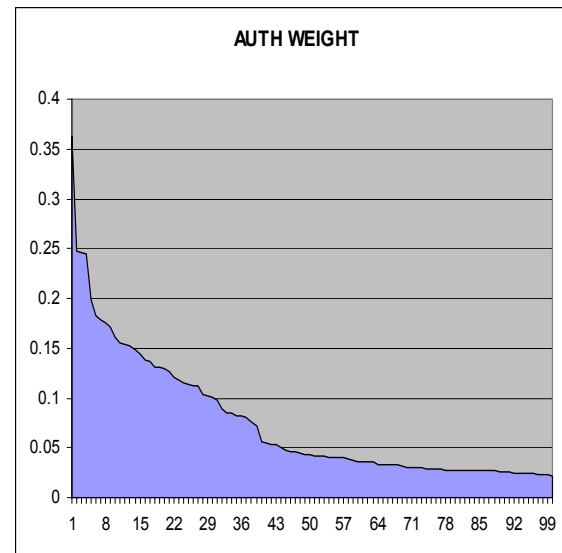
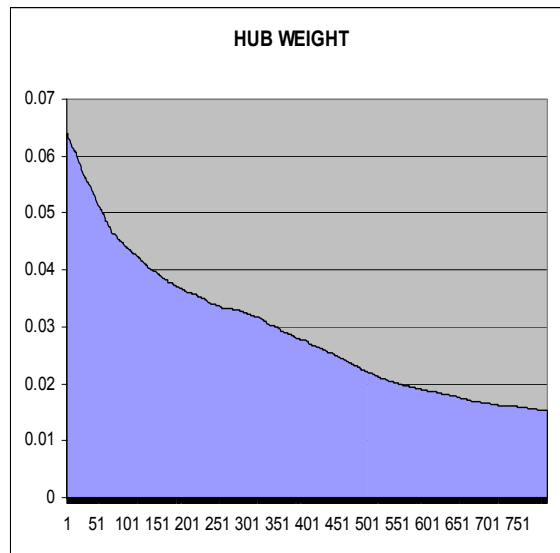
## Coq Communities

- Logic/Berardi/inv Arith/Wf\_nat/induction\_gtof1  
Arith/Wf\_nat/lt\_wf\_rec1 IntMap/Mapaxioms/MapMerge\_assoc  
Logic/Berardi/i Logic/Berardi/j Bool/Bvector/Vconst
- Bool/Bvector/vector\_rec Bool/Bvector/vector\_ind  
Init/Datatypes/bool\_ind Init/Datatypes/bool\_rec
- Logic/ClassicalFacts/f1\_o\_f2  
IntMap/Mapaxioms/FSetUnion\_idempotent  
IntMap/Mapc/MapMerge\_idempotent\_c Logic/Diaconescu/proof\_irrel  
Logic/Berardi/retract\_rect IntMap/Mapaxioms/MapMerge\_assoc  
Logic/Eqdep/eq\_dep\_dep1 Logic/Eqdep/eq\_dep1\_eq
- Relations/Newman/Newman Init/Datatypes/bool\_rect  
Bool/Bvector/vector\_rect IntMap/Mapaxioms/MapMerge\_assoc

## Coq Communities II

- Logic/Hurkens/lemma2 Logic/Hurkens/U Logic/Hurkens/sb  
Logic/Hurkens/le Logic/Hurkens/U
- Init/Logic\_Type/identity\_rect\_r Init/Logic\_Type/identity\_rec\_r  
Init/Logic\_Type/identity\_ind\_r Init/Datatypes/identity\_rect
- romeo/ReflOmegaCore/Tred\_factor3\_stable  
omega/OmegaLemmas/fast\_Zred\_factor3  
ZArith/auxiliary/Zred\_factor3 romeo/ReflOmegaCore/Tred\_factor3
- ring/Ring\_abstract/minus\_varlist\_insert\_ok  
ring/Ring\_abstract/minus\_varlist\_insert  
ring/Ring\_theory/Th\_plus\_zero\_left2 ring/Ring\_theory/Th\_plus\_comm

# Coq HITS



- Smoother weight degradation
- Very small hub values

# References

- P. Aczel. Notes on the simply typed lambda calculus. In Berger and Schwichtenberg. 1999.
- P. Aczel. The type theoretic interpretation of constructive set theory: Inductive definition. In Logic, Methodology and Philosophy of Science VII.1986.
- P. Aczel and M. Rathjen. Notes on Constructive Set Theory. Mittag-Leffler Technical Report No.40, 2000/2001.
- P. Aczel. The type theoretic interpretation of constructive set theory. In Logic Colloquium '77.
- P. Aczel. The type theoretic interpretations of constructive set theory: Choice principles. In The L.E.J. Brouwer Centenary Symposium. 1982.
- S. Allen. Abstract identifiers, intertextual reference and a computational basis for recordkeeping. First Monday, 9(2), 2004. [www.firstmonday.org](http://www.firstmonday.org)
- S. Allen. A Non-type-theoretic Definition of Martin-Lof's Types. In Gries. 1997.
- H. Barendregt and H. Geuvers. Proof Assistants using dependent type systems. In Handbook of Automated Reasoning. 2001.
- S. Berghofer. Proofs, Programs and Executable Specifications in Higher Order Logic. PhD thesis, Technische Universität München, 2003.
- S. Berghofer and T. Nipkow. Executing higher order logic. In Types for Proofs and Programs: TYPES 2000. 2002.d
- R. Constable. Types in logic, mathematics and programming. In S. R. Buss, editor, Handbook of Proof Theory. 1998.
- D. Howe. Importing mathematics from HOL into Nuprl. In Theorem Proving in Higher Order Logics, volume 1125, of Lecture Notes in Computer Science. 1996.
- D. Howe. Semantic foundations for embedding HOL in Nuprl. In volume 1101 of Lecture Notes in Computer Science. 1996.
- E. Moran. Adding Intersection and Union Types to Howe's Model of Type Theory [working title]. PhD thesis, Cornell University, 2003.