

# The Static Debugger: classical realizability applied to debugging

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LIP, ENS Lyon

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1 Debugging & logic

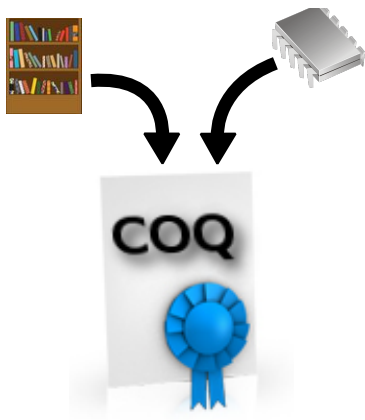
2 A Solution

3 Experimentation

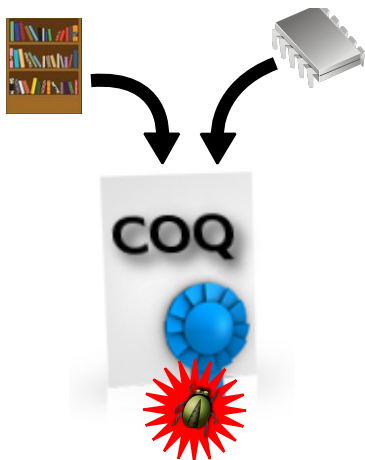
# Motivation: Static debugger



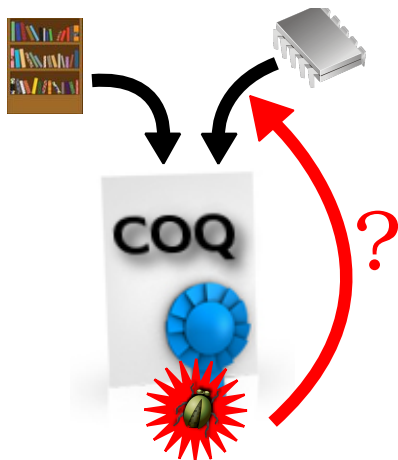
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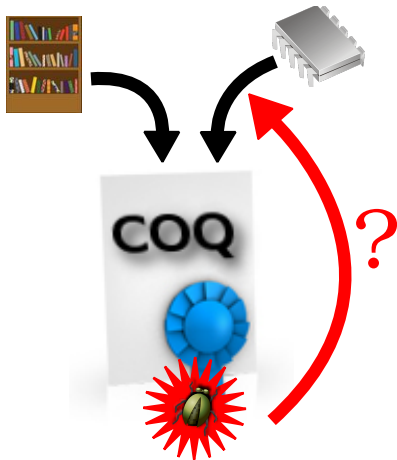
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We will need:

- the correctness proof of the program
- the bug report
- the implementations of the external tools

→ independent of the programming language

# Logical formalization

$$\frac{\overbrace{\vdash (\forall x, Ax) \Rightarrow \forall y, By}^{\text{program certification}} \quad \overbrace{\not\vdash By_0}^{\text{bug report}}}{\underbrace{\not\vdash Ax?}_{\text{bug report for one external tool}}} \text{Experimental Modus Tollens}$$

$A$  and  $B$   $\forall/\exists$ -free formulæ containing external predicates



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$A$  and  $B$   $\forall/\exists$ -free formulæ containing external predicates

which can be further reduced to

$$\frac{\forall x, Ax \vdash \perp}{\not\vdash Ax?} \text{Experimental Effectiveness}$$

- ➔ We want to exhibit a **counter-example** ( $\not\vdash Ax?$ )  
from a **proof of contradiction** ( $\forall x, Ax \vdash \perp$ )

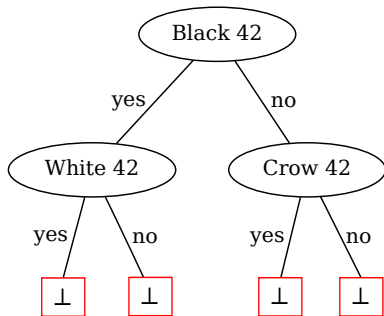
# From a counter-example to a Herbrand tree

- In the universal theory  $U = \forall x, A x$ ,  $A x$  is  $\forall/\exists$ -free and contains external predicates and functions  
 $\rightsquigarrow$  e.g. library functions
  - We want to abstract on the interpretation (i.e. a specific implementation of the external tools)  
 $\rightsquigarrow$  no test to perform anymore
- ➔ we need a **Herbrand tree** = tree of possible interpretations  
= BDD of counter-examples

# Herbrand trees through an example

- **atoms** (= atomic formulæ)
  - Crow  $n$
  - Black  $n$
  - White  $n$
- a (finite) inconsistent theory
  - $A_1 : \forall n, \text{Crow } n \implies \text{Black } n$
  - $A_2 : \forall n, \neg(\text{Black } n \wedge \text{White } n)$
  - $A_3 : \text{Crow } 42$
  - $A_4 : \text{White } 42$
- **contradictions** on the leaves

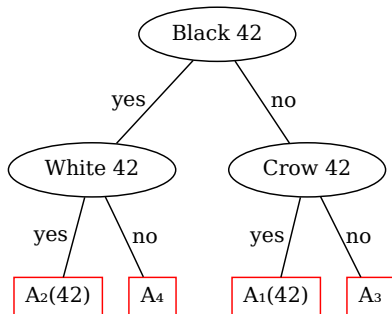
White crow example



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plus **counter-examples**

White crow example



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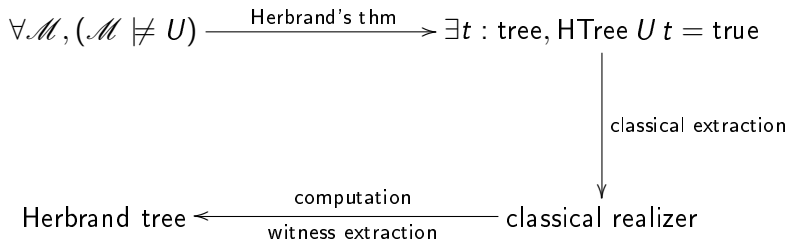
# The proposed solution

## Extract Herbrand's theorem with classical realizability

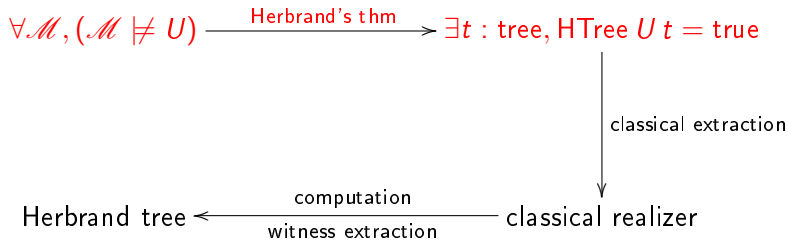
### Theorem (Herbrand)

Let  $U$  be a universal theory.

If for all interpretations  $\mathcal{M}$ ,  $\mathcal{M} \not\models U$ , then  $U$  has a Herbrand tree.



## Herbrand's theorem



# Herbrand's Theorem proof

## Theorem (Herbrand)

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# Herbrand's Theorem proof

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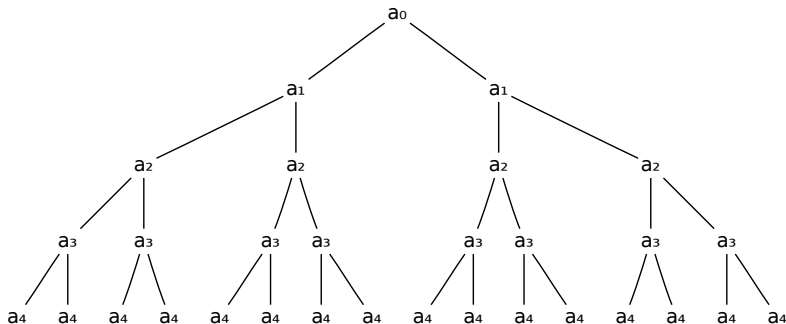
*If for all interpretations  $\mathcal{M}$ ,  $\mathcal{M} \not\models U$ , then  $U$  has a Herbrand tree.*

Let us fix an enumeration  $(a_i)_{i \in \mathbb{N}}$  of the atoms.  
(atoms = atomic formulæ)

# Herbrand's Theorem proof

## Theorem (Herbrand)

*If for all interpretations  $\mathcal{M}$ ,  $\mathcal{M} \not\models U$ , then  $U$  has a Herbrand tree.*

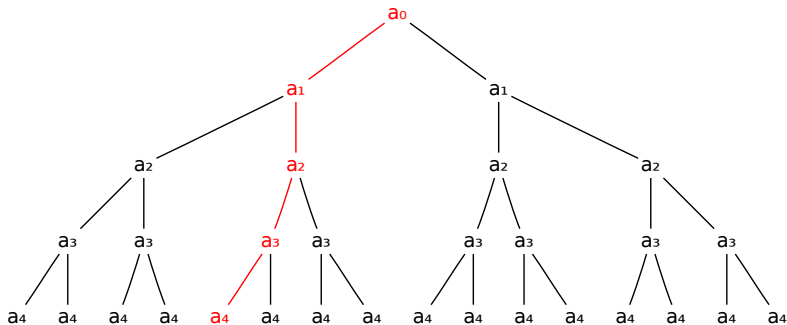


consider the atom-enumerating complete infinite tree

# Herbrand's Theorem proof

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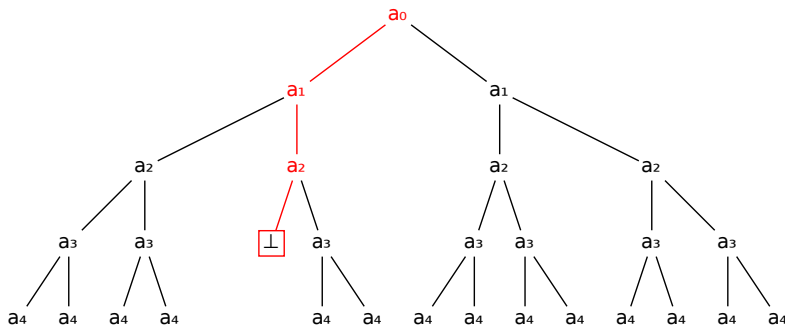


pick any infinite branch

# Herbrand's Theorem proof

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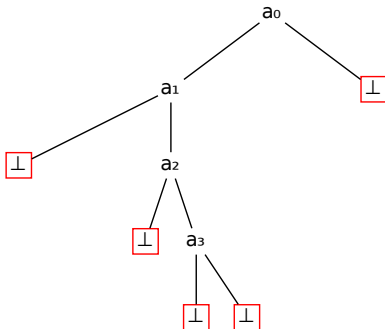


by hypothesis (and compactness), we can cut it at finite depth

# Herbrand's Theorem proof

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conclude using König's lemma

# Formalized proof

Usual proof of Herbrand's theorem

➔ uses the compactness theorem and König's lemma

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Uses *reductio ad absurdum*.

Builds an infinite branch in a “potential Herbrand tree”.

- 1 suppose there is no Herbrand tree
- 2 show that any partial interpretation consistent with the theory can be extended into a longer one
- 3 let  $u$  be the union of the increasing sequence built by extension from the empty path  
➔ it is the infinite branch
- 4 show that  $u$  contains no contradiction and is a model of  $U$  (by syntactic compactness)



# Coq implementation



We need the proof to be **classically extractable**

Some aspects of the proof:

- the proof is parametrized by two abstract data types
  - the signature
  - the theory  $U$
- 2 axioms added to Coq: (in Prop only)
  - excluded middle:  $\forall P : \text{Prop}, P \vee \neg P$
  - proof irrelevance:  $\forall P : \text{Prop}, \forall p_1 p_2 : P, p_1 = p_2$
- decidable vs. undecidable
  - extraction requires finite objects with decidable properties
  - but the proof uses (at some point) infinite objects

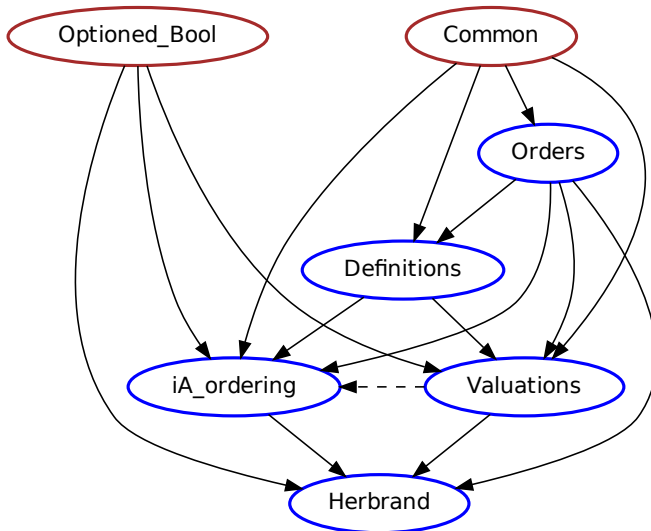
# The guts of the proof

## 1 The real statement

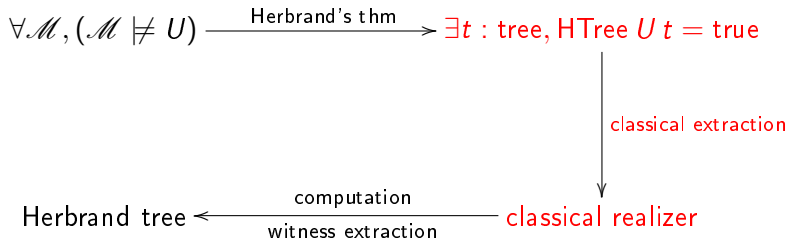
$$\begin{aligned} &\forall \text{atom} : \text{Set}, \\ &\forall \text{index} : \text{Set}, \forall U : \text{index} \rightarrow \text{compound}, \\ &(\forall \text{val} : \text{atom} \rightarrow \text{Prop}, \neg(\forall i : \text{index}, \text{eval val } (U i))) \\ &\rightarrow \exists t : \text{tree}, \text{HTree } U t = \text{true} \end{aligned}$$

- ## 2 Boolean equality and order on dependent pairs $\langle i, a \rangle$ ( $a \in U i$ )
- (requires the same for atom and index)
- ➡ used to prove that the infinite branch we build is a model

# The structure of the proof



# Extraction



# The syntactic extraction function

- source language:  $\text{CoC}_\omega$  + Peirce's law
- target language:  $\lambda$ -calculus + call/cc

$$\begin{array}{lcl}
 \text{CoC}_\omega + \text{Peirce} & \xrightarrow{*} & \lambda_c \\
 x^* & = & x \\
 (\lambda x : T.M)^* & = & \lambda x.M^* \\
 (MN)^* & = & M^* N^* \\
 (\Pi \_ )^* & = & \text{any term} \\
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## Remarks

- types are erased because they have no computational content
- all sorts are treated the same way

# Toward $CIC_{\omega}$ : adding inductive

Inductive data structure are encoded by elimination

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Inductive data structure are encoded by elimination

- in  $Coq$

```

Inductive foo p1 p2 :=
  | C1 : foo p1 p2
  | C2 a : foo p1 p2
  | C3 b1 b2 b3 : foo p1 p2
  
```

- in  $\lambda_c$  (Jivaro syntax)

```

Define C1 =  $\lambda p_1 \lambda p_2$   $\lambda e_1 \lambda e_2 \lambda e_3$   $e_1$ 
Define C2 =  $\lambda p_1 \lambda p_2$   $\lambda a$   $\lambda e_1 \lambda e_2 \lambda e_3$   $e_2 a$ 
Define C3 =  $\lambda p_1 \lambda p_2$   $\lambda b_1 \lambda b_2 \lambda b_3$   $\lambda e_1 \lambda e_2 \lambda e_3$   $e_3 b_1 b_2 b_3$ 
  
```

➡ matching is the identity!



# Correctness of the extraction: realizability model for PA2

Classical realizability is a “negative interpretation” of formulæ  
**but keeps intuitionistic typing rules**

- ➡ formulæ are interpreted by sets of stacks (“falsity values”)
- ➡ realizers are defined by orthogonality to those stacks

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## Examples

$$\begin{array}{l} \lambda x. x \quad \Vdash \quad \forall Z, Z \Rightarrow Z \\ \text{call/cc} \quad \Vdash \quad \forall A \forall B, ((A \Rightarrow B) \Rightarrow A) \Rightarrow A \end{array}$$

- ➔ intuition: realizers of  $\perp$  trigger **backtracks**

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## Theorem (Adequacy)

*Every formula provable in PA2 has a universal realizer.*

# What happens beyond PA2?

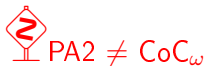
Different realizability models:

- PA2 [\[Krivine, 2010\]](#)
- ZF [\[Krivine, 2001\]](#)
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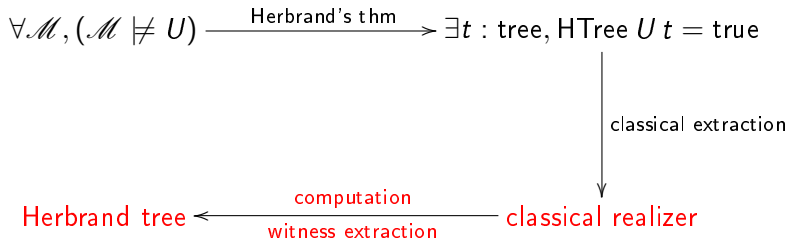
Different realizability models:

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Hopefully, the 2<sup>nd</sup> order fragments of their realizability models are isomorphic

## Witness extraction



Computation framework: Krivine's machine for  $\lambda$ -calculus

- terms:  $t = x \mid \lambda x.t \mid t t$
- stacks:  $\pi = \varepsilon \mid t \cdot \pi$  ( $t$  closed)
- processes:  $t \star \pi$  ( $t$  closed)
- evaluation relation  $\gamma$  :

$$\begin{array}{lll} \text{Grab} & \lambda x.t \star u \cdot \pi & \gamma \quad t[u/x] \star \pi \\ \text{Push} & t u \star \pi & \gamma \quad t \star u \cdot \pi \end{array}$$

Computation framework: Krivine's machine for  $\lambda_c$ -calculus

- terms:  $t = x \mid \lambda x.t \mid t t \mid \text{call/cc} \mid k_\pi \mid \dots$
- stacks:  $\pi = \varepsilon \mid t \cdot \pi$  ( $t$  closed)
- processes:  $t \star \pi$  ( $t$  closed)
- evaluation relation  $\gamma$  :

Grab	$\lambda x.t \star u \cdot \pi$	$\gamma$	$t[u/x] \star \pi$
Push	$t u \star \pi$	$\gamma$	$t \star u \cdot \pi$
Save	$\text{call/cc} \star t \cdot \pi$	$\gamma$	$t \star k_\pi \cdot \pi$
Restore	$k_\pi \star t \cdot \pi'$	$\gamma$	$t \star \pi$
⋮	⋮ ⋆ ⋮	$\gamma$	⋮ ⋆ ⋮



# Witness extraction

When we have a realizer of a decidable  $\Sigma_1$  formula

$$t \Vdash \exists x : T, f(x) = 0 \\ \equiv \forall Z, (\forall x, T(x) \rightarrow f(x) = 0 \rightarrow Z) \rightarrow Z$$

it eventually evaluates into a pair  $\langle w, j \rangle$  where

- $w$  is a witness (a realizer of  $x : T$ )
- $j$  is the justification of  $w$  (a realizer of  $f(w) = 0$ )

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But  $j$  (and  $w$ ) can backtrack!

$\rightsquigarrow$   $w$  is not necessarily a correct witness

$\rightsquigarrow$  we need to evaluate the proof

➡ it explains why we keep proof information during extraction

We use  $t (M_T (\lambda w \lambda p. j (\text{stop } w)))$

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# General usage

- 1 apply Herbrand's theorem to the inconsistency proof
- 2 extract the resulting theorem with `kextraction`
- 3 realize extra axioms used
  - excluded middle:  $\lambda\_ \lambda g \lambda h. \text{call/cc}(\lambda f. h(\lambda x. f(g\ x)))$
  - proof irrelevance:  $\lambda\_ \lambda\_ \lambda\_ \lambda x. x$
- 4 optimize realizers to speed up execution  
↪ especially for code extracted from proofs (in `Prop`)
- 5 evaluate and retrieve actual trees with the wrapper

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  - 5 evaluate and retrieve actual trees with the wrapper
- ➔ certified program but slow
- ➔ depends on the quality of the proof of Herbrand's theorem

## (Old) Experimentation results: why we need optimization

Example	$T_{\text{extract}}$ (s.)	$T_{\text{optim}}$ (s.)
1 ( $k = 10$ )	0.20	0.10
1 ( $k = 50$ )	1.92	0.29
1 ( $k = 100$ )	6.70	0.54
1 ( $k = 500$ )	163.66	2.51
1 ( $k = 1000$ )	646.63	5.03
2 ( $k = 42$ )	4.30	1.10
2 ( $k = 1337$ )	2832.41	29.90

- 1 =  $\forall n, P n \rightarrow P (S n) \wedge P 0 \wedge \neg P k$
- 2 = White Crow theory



# Realizer optimization

## Semantic optimization

Change the data type representation during extraction



it changes the realizability model and the adequacy lemma

e.g. primitive integers

- space savings: unary integers  $\rightsquigarrow$  binary integers
- time savings: unary functions  $\rightsquigarrow$  native operations

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## Code optimization (mostly for Prop)

Replace extracted realizers by more efficient ones

currently only for obvious cases:

e.g. chains of arithmetical equalities  $\rightsquigarrow \lambda x.x$

Example: commutativity of  $+_{\text{nat}}$ 

(extracted realizer)

```

Coq.Init.Datatypes.nat_rect =
  \P\f\fo .fix_1_1 (\F\n Coq.Init.Datatypes.nat%case n f (\n fo n (F n)))
Coq.Init.Datatypes.nat_ind =
  \P Coq.Init.Datatypes.nat_rect P
Coq.Init.Peano.plus_n_0 =
  \n
    Coq.Init.Datatypes.nat_ind
      .type (Coq.Init.Logic.refl_equal .type (nat 0))
    (\n\IHn
      Coq.Init.Logic.f_equal
        .type .type Coq.Init.Datatypes.S n (Coq.Init.Peano.plus n (nat 0))
      IHn) n
Coq.Init.Peano.plus_n_Sm =
  \n\m
    Coq.Init.Datatypes.nat_ind
      .type (Coq.Init.Logic.refl_equal .type (Coq.Init.Datatypes.S m))
    (\n\IHn
      Coq.Init.Logic.f_equal
        .type .type Coq.Init.Datatypes.S
          (Coq.Init.Datatypes.S (Coq.Init.Peano.plus n m))
          (Coq.Init.Peano.plus n (Coq.Init.Datatypes.S m)) IHn) n
Coq.Arith.Plus.plus_comm =
  \n\m
    Coq.Init.Datatypes.nat_ind
      .type (Coq.Init.Peano.plus_n_0 m)
    (\y\H
      Coq.Init.Logic.eq_ind
        .type (Coq.Init.Datatypes.S (Coq.Init.Peano.plus m y)) .type
          (Coq.Init.Logic.f_equal
            .type .type Coq.Init.Datatypes.S (Coq.Init.Peano.plus y m)
              (Coq.Init.Peano.plus m y) H)
          (Coq.Init.Peano.plus m (Coq.Init.Datatypes.S y)))

```

Example: commutativity of  $+_{\text{nat}}$ 

(optimized realizer)

```
Coq.Arith.Plus.plus_comm =  
  \n\m\z z
```

# Conclusion & Perspectives

- first real use of classical realizability & extraction
  - certified algorithm to extract Herbrand trees
  - strong links between inconsistency proof and extracted tree  
     $\rightsquigarrow$  improvement over Herbrand's proof
  - we still do not understand how the program computes
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- improve performances to face real-life examples
  - optimization theory for classical realizability

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