

# Systematic Exploration of Mathematical Theories

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# Theory of Natural Numbers

- Language:
  - $\mathcal{L}_{\mathbb{N}} = \langle \langle is-nat, = \rangle, \langle +, id \rangle, \langle 0 \rangle \rangle$ ,  
(predicates, functions, constants);
- Knowledge Base (KB):
  - equality axioms (lifted to inference);
  - Peano's axioms: generation and uniqueness axioms;
  - induction axiom (lifted to inference);
- Inference mechanism (inference rules):
  - rewriting lifted from equality axioms;
  - general predicate logic inference rules;
  - structural induction lifted from induction axiom;



# Knowledge Schemes

- higher-order formulae ("interesting" mathematical knowledge);
- stored in libraries of schemes;
- used by instantiation (become first-order);
- Example (Theory Dependent Schemes).

$$\begin{array}{c} \forall_{f,g,h} (\text{is-rec-nat-binary-fct-1r}[f,g,h] \Leftrightarrow \\ * \qquad \qquad \qquad \forall_{\text{is-nat}[x,y]} \wedge \left\{ \begin{array}{l} f[x,0] = g[x] \\ f[x,y^+] = h[f[x,y]] \end{array} \right. \end{array}$$



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# Knowledge Schemes

- Example (Theory Independent Schemes).

algebraic structures

is-semigroup

is-monoid

is-group

is-ring

is-unity-ring

is-integral-domain

relational structures

is-preorder

is-partial-ordering

is-total-partial-ordering

is-strict-partial-ordering

is-total-strict-partial-ordering



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$$\forall_{p, op} (is\text{-semigroup}[p, op] \Leftrightarrow \forall_{p[x,y,z]} \wedge \left\{ \begin{array}{l} p[op[x, y]] \\ op[x, op[y, z]] = op[op[x, y], z] \end{array} \right. )$$



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$$\forall_{p, op, zero} (\text{is-monoid}[p, op, zero] \Leftrightarrow \forall_{p[x]} \wedge \left\{ \begin{array}{l} \text{is-semigroup}[p, op] \\ op[x, zero] = x \end{array} \right. )$$



# Scheme-Based Exploration Model (Buchberger)

Develop a theory in exploration rounds:

- introduce new notions (functions, predicates) with definition schemes;
- introduce and prove (or disprove) propositions about the notions with proposition schemes;
- introduce problems using algorithm schemes and solve them;
- introduce new inference rules by lifting knowledge or with inference schemes;



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## Example 1. Obtaining interesting functions

### Introduce function symbols (+)

- $\forall_{f,g,h} (\text{is-rec-nat-binary-fct-1r}[f, g, h] \Leftrightarrow$ 
  - $\forall_{\text{is-nat}[x,y]} \wedge \left\{ \begin{array}{l} f[x, 0] = g[x] \\ f[x, y^+] = h[f[x, y]] \end{array} \right. \right),$
- possible instantiations:  
 $\{f \rightarrow \oplus, g \rightarrow id, h \rightarrow +\}, \{f \rightarrow \boxplus, g \rightarrow +, h \rightarrow +\},$   
 $\{f \rightarrow \odot, g \rightarrow id, h \rightarrow id\}, \{f \rightarrow \boxdot, g \rightarrow +, h \rightarrow id\}$
- for  $\{f \rightarrow \oplus, g \rightarrow id, h \rightarrow +\}$
- we obtain:  $x \oplus 0 = x$   
 $x \oplus y^+ = (x \oplus y)^+$
- Remark:  $\oplus$  is in fact  $+$ ;



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# Example 1. Obtaining interesting functions

Introduce function symbols (+)

Properties	+	$\boxplus$	$\odot$	$\oslash$
sort	✓	✓	✓	✓
associativity	✓	✗	✓	✗
commutativity	✓		✗	
identity	✓			
inverse	✗			



- introduce propositions:

- is-rec-nat-binary-fct-1l[+, id, +]* (an equivalent definition);
- is-semigroup[is-nat, +]* (the type and the associativity);
- is-monoid[is-nat, +, 0]*;
- is-commutative-monoid[is-nat, +, 0]* (commutativity);
- is-group[is-nat,  $\oplus$ , 0,  $\ominus$ ]* (use lazy thinking to synthesize  $\ominus$ , the problem has no solution);
- which are automatically proven using the *Theorema* system;



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## Example 2. Inventing significant results

Problem Scheme: decomposition w.r.t  $\otimes$

- $\forall_{obj, p_1, p_2, p_3, \otimes} FBDp[obj, p_1, p_2, p_3, \otimes] \Leftrightarrow \forall_{\substack{obj[x,y] \\ p_1[x], p_2[y]}} \exists_{\substack{obj[z] \\ p_3[z]}} x = y \otimes z.$
- for  $\{obj \rightarrow is-nat, p_1 \rightarrow true, p_2 \rightarrow true, p_3 \rightarrow true, \otimes \rightarrow *\}$ :
  - $\forall_{is-nat[x,y]} x = y * q[x, y], (1)$
- for which we propose the solution algorithm:
$$\forall_{q,g,h} is-nat-step-recl-fct-1-1[q, g, h] \Leftrightarrow$$
  - $$\forall_{\substack{is-nat[x,y] \\ y>0}} q[x, y] = \begin{cases} g[x] & \Leftarrow x < y \\ h[q[x - y, y]] & \Leftarrow \text{otherwise} \end{cases}, (2)$$
- we prove (1) using (2).



## Example 2. Inventing significant results

Prove  $\forall_{is\text{-}nat[x,y]} x = y * q[x,y]$

- first proof attempt: FAILURE!, but we change the problem:

- $\forall_{is\text{-}nat[x]}_{is\text{-}positive[y]} x = y * q[x,y]$

- second proof attempt: FAILURE!, but we change the problem:

- $\forall_{is\text{-}nat[x]}_{is\text{-}positive[y]} x = y * q[x,y] + r[x,y].$

- third proof attempt: summary of the proof.



## Example 2. Inventing significant results

- Prove  $\forall_{\substack{\text{is-nat}[x] \\ \text{is-positive}[y]}} x = y * q[x, y] + r[x, y]$ , using:
  - $s1[q, g, h] : \forall_{\substack{\text{is-nat}[x, y] \\ y > 0}} q[x, y] = \begin{cases} \textcolor{red}{g}[x] & \Leftarrow x < y \\ \textcolor{blue}{h}[q[x - y, y]] & \Leftarrow \text{otherwise} \end{cases}$ ,
  - $s2[r, k, t] : \forall_{\substack{\text{is-nat}[x, y] \\ y > 0}} r[x, y] = \begin{cases} \textcolor{red}{k}[x] & \Leftarrow x < y \\ \textcolor{blue}{t}[r[x - y, y]] & \Leftarrow \text{otherwise} \end{cases}$ ,
- ...details skipped, but in the proof we have to show:
  - $y_0 * \textcolor{blue}{h}[q[x_0 - y_0, y_0]] + \textcolor{blue}{t}[r[x_0 - y_0, y_0]] = y_0 * (\textcolor{blue}{q}[x_0 - y_0, y_0] + 1) + \textcolor{blue}{r}[x_0 - y_0, y_0]$ .
  - we generate the conjectures  $\textcolor{blue}{h}[x] = x + 1$ ,  $\textcolor{blue}{t}[y] = y$
  - similarly we generate  $\textcolor{red}{g}[x] = 0$ ,  $\textcolor{red}{k}[x] = x$ .



## Example 2. Inventing significant results

- Prove  $\forall_{\substack{\text{is-nat}[x] \\ \text{is-positive}[y]}} x = y * q[x, y] + r[x, y]$ , using:
  - $s1[q, g, h] : \forall_{\substack{\text{is-nat}[x, y] \\ y > 0}} q[x, y] = \begin{cases} \textcolor{red}{g}[x] & \Leftarrow x < y \\ \textcolor{blue}{h}[q[x - y, y]] & \Leftarrow \text{otherwise} \end{cases}$ ,
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- we obtain:
  - $\textcolor{red}{g}[x] = 0, \textcolor{blue}{h}[x] = x + 1 \Rightarrow q[x, y] = \begin{cases} 0 & \Leftarrow x < y \\ q[x - y, y] + 1 & \Leftarrow \text{otherwise} \end{cases}$ ,
  - $\textcolor{red}{k}[x] = x, \textcolor{blue}{t}[y] = y \Rightarrow r[x, y] = \begin{cases} \textcolor{red}{x} & \Leftarrow x < y \\ \textcolor{blue}{r}[x - y, y] & \Leftarrow \text{otherwise} \end{cases}$ ,
- Remark:
  - $q \leftarrow \text{quotient function symbol};$
  - $r \leftarrow \text{remainder function symbol}$



# Summary

- Development of Natural Numbers

Functions	$+ id$	$+ *$	$\wedge$	$-$	$- quot$	$rem$	$gcd$
Predicates	$is\text{-}nat =$			$\leq$	$< is\text{-}pos$	$  \triangleright$	$is\text{-}prime$
Constants	0		1				
Inference Rules	SI		CI		WFI		

- Invention of Significant Results

- Decomposition of natural numbers
- $\Rightarrow$  quotient-remainder theorem
- Decomposition w.r.t well-founded orderings.
- $\Rightarrow$  prime decomposition theorem

- Further Work

- apply the model for the exploration of the theory of integers



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- Invention of Significant Results

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# Implementation

## In Theorema

- new provers:
  - NNIP (structural induction);
  - NNCIP (complete induction);
  - NNWFIP (well-founded induction w.r.t.  $<$ ,  $\triangleleft$ );
- mathematical knowledge bases:
  - libraries of knowledge schemes;
  - exploration rounds in the theory of natural numbers (integers);
- additional tools:
  - the *UseScheme* function (invents new symbols);



# Conclusion

- scheme-based exploration model is successfully applied;
- advantages of the model:
  - offer a methodology for theory exploration
    - $\Rightarrow$  didactical and practical value.
  - leads to the invention of significant results;
  - significant potential for [semi]automated exploration/discovery of theories
    - $\Rightarrow$  important for practical theorem proving and program verification.



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Thank you for your attention.