

# Full Functional Verification of Linked Data Structures

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# Goal

Verify **full functional correctness** of  
**linked data structure** implementations

# What is Full Functional Correctness?

- Complete, precise formal specification
- Captures every property client needs (except resource consumption)
- Implementation satisfies specification

# Benefits of Full Functional Correctness

- Complete, precise, unambiguous interfaces for linked data structures
- Enables sound reasoning with specification (can discard implementation when reasoning)
  - Human developers
  - Automated analyses of client code
- First complete realization of concept of abstract data types

Example

# Hashtable Specification

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
  //: public ghost specvar init :: "bool" = "false";  
  
  public Object put(Object key, Object value)  
  /*: requires "init  $\wedge$  key  $\neq$  null  $\wedge$  value  $\neq$  null"  
     modifies content  
     ensures "content = old content - {(key, result)}  $\cup$  {(key, value)}  $\wedge$   
              (result = null  $\rightarrow$   $\neg(\exists v. (key, v) \in$  old content))  $\wedge$   
              (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

- Specifications at class granularity
- Specifications appear as comments
- Can use standard Java compilers

# Abstract State as Sets, Relations

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
  //: public ghost specvar init :: "bool" = "false";  
  
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      (result = null  $\rightarrow$   $\neg(\exists v. (key, v) \in$  old content))  $\wedge$   
      (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

- Represent abstract state using specification variables
- Contents of hash table as set of key-value pairs

# Method Preconditions, Postconditions

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
  //: public ghost specvar init :: "bool" = "false";  
  
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              (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

- Standard assume-guarantee reasoning for method interfaces
- Pre-, post-conditions in higher-order logic (HOL)



# Requires Clause

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
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              (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

Pre-condition requires that key  
and value be non-null

# Modifies Clause

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
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  public Object put(Object key, Object value)  
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      (result = null  $\rightarrow$   $\neg(\exists v. (key, v) \in$  old content))  $\wedge$   
      (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

- Modifies clause gives frame condition
- **put** method modifies only *content*

# Ensures Clause

```
class Hashtable {  
  //: public ghost specvar content :: "(obj * obj) set" = "{}";  
  //: public ghost specvar init :: "bool" = "false";  
  
  public Object put(Object key, Object value)  
  /*: requires "init  $\wedge$  key  $\neq$  null  $\wedge$  value  $\neq$  null"  
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      (result  $\neq$  null  $\rightarrow$  (key, result)  $\in$  old content)" */  
  { ... }  
  ...  
}
```

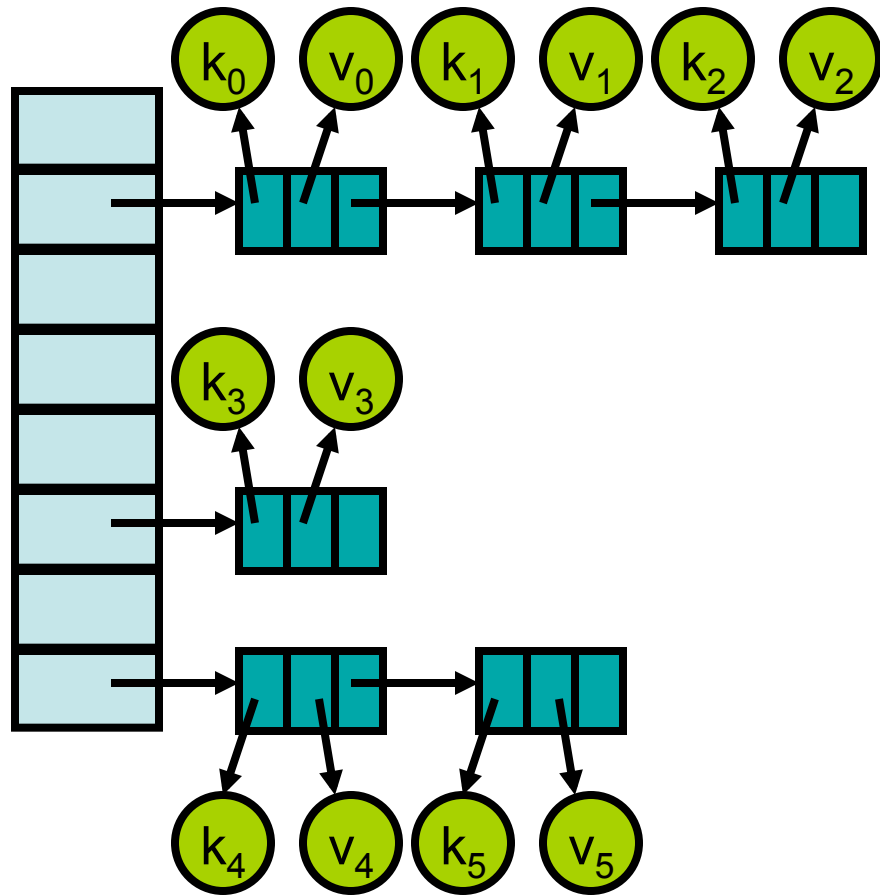
- Previous key-value binding is removed
- New binding is added

# Ensures Clause

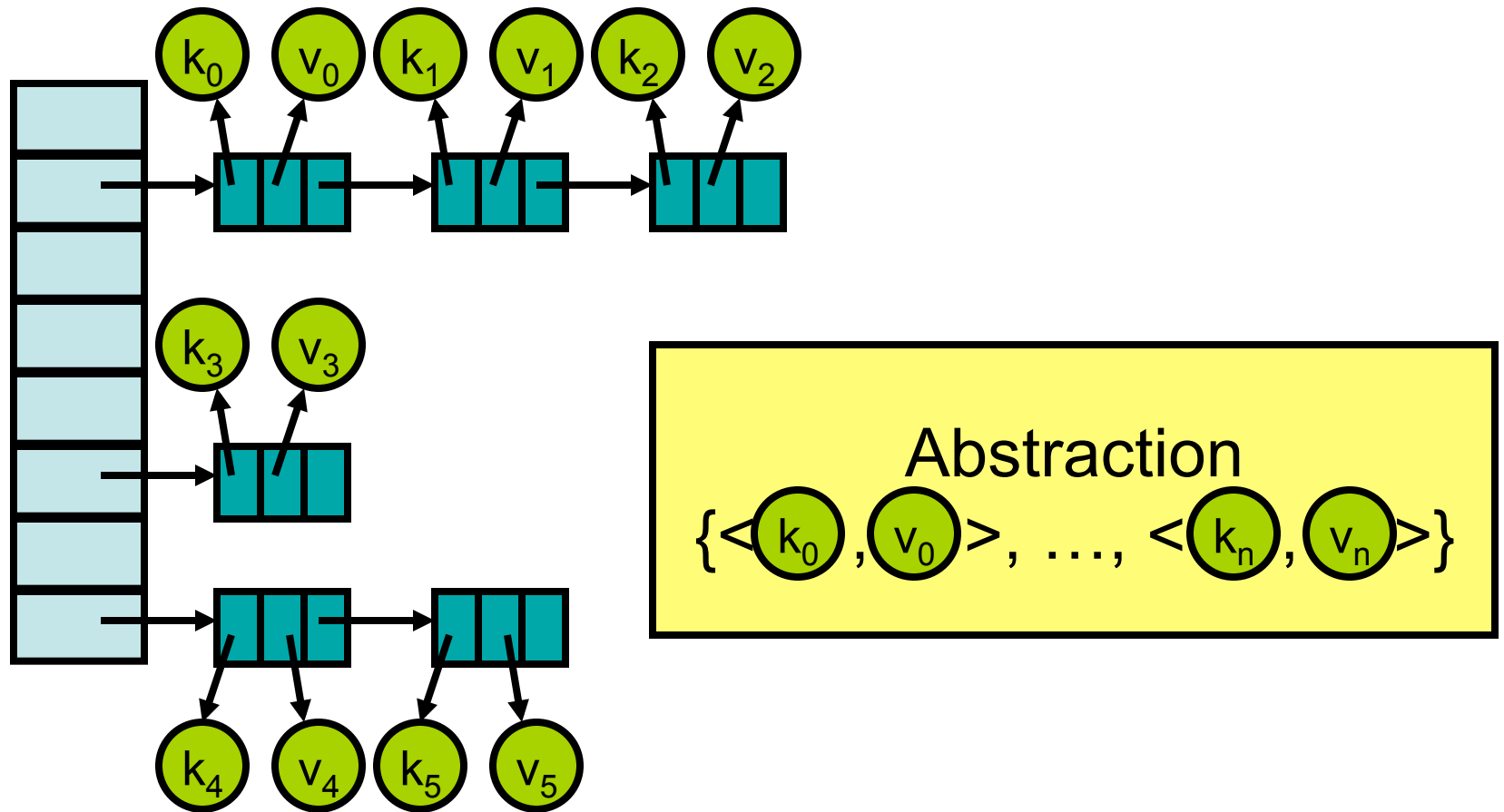
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              (result  $\neq$  null  $\rightarrow (key, result) \in$  old content)" */  
  { ... }  
  ...  
}
```

Returns previously-bound value or null

# Hashtable Data Structure



# Hashtable Data Structure



# Abstraction Function

/\*: **invariant** ContentDef:

“init  $\rightarrow$  content =  $\{(k,v). (\exists i. 0 \leq i \wedge i < \text{table.length} \wedge (k,v) \in \text{table}[i].\text{bucketContent})\}$ ”

**static ghost specvar** bucketContent :: “obj  $\Rightarrow$  (obj \* obj) set” = “ $\lambda n. \{\}$ ”

**invariant** bucketContentNull: “null.bucketContent =  $\{\}$ ”

**invariant** bucketContentDef: “ $\forall x. x \in \text{Node} \wedge x \in \text{alloc} \wedge x \neq \text{null} \rightarrow x.\text{bucketContent} = \{<x.\text{key}, x.\text{value}>\} \cup x.\text{next}.\text{bucketContent} \wedge (\forall v. (x.\text{key}, v) \notin x.\text{next}.\text{bucketContent})$ ”

**invariant** Coherence:

“init  $\rightarrow (\forall i k v. (k,v) \in \text{table}[i].\text{bucketContent} \rightarrow i = \text{hash } k \text{ table.length})$ ”

**static specvar** hash :: “obj  $\Rightarrow$  int  $\Rightarrow$  int”

**vardefs** “hash ==  $\lambda k. (\lambda n. (\text{abs } (\text{hashFunc } k)) \text{ mod } n)$ ”

**static specvar** abs :: “int  $\Rightarrow$  int”

**vardefs** “abs ==  $\lambda m. (\text{if } (m < 0) \text{ then } -m \text{ else } m)$ ”

...

\*/

- Invariants
- Dependent specification variables

# Abstraction Function

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“init  $\rightarrow$  content =  $\{(k,v). (\exists i. 0 \leq i \wedge i < \text{table.length} \wedge (k,v) \in \text{table}[i].\text{bucketContent})\}$ ”

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...

\*/

Hash table contents  
consists of the contents  
of all the buckets



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**vardefs** “abs ==  $\lambda m. (\text{if } (m < 0) \text{ then } -m \text{ else } m)$ ”

...

\*/

- Contents of each bucket defined recursively over linked list
- Keys are unique

# Abstraction Function

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“init  $\rightarrow$  content =  $\{(k,v). (\exists i. 0 \leq i \wedge i < \text{table.length} \wedge (k,v) \in \text{table}[i].\text{bucketContent})\}$ ”

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**vardefs** “abs ==  $\lambda m. (\text{if } (m < 0) \text{ then } -m \text{ else } m)$ ”

...

\*/

Every key is in the  
correct bucket

# Abstraction Function

/\*: **invariant** ContentDef:

“init  $\rightarrow$  content =  $\{(k,v). (\exists i. 0 \leq i \wedge i < \text{table.length} \wedge (k,v) \in \text{table}[i].\text{bucketContent})\}$ ”

**static ghost specvar** bucketContent :: “obj  $\Rightarrow$  (obj \* obj) set” = “ $\lambda n. \{\}$ ”

**invariant** bucketContentNull: “null bucketContent =  $\{\}$ ”

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...

\*/

set expressions

quantifiers

lambda expressions

# Loop Invariants

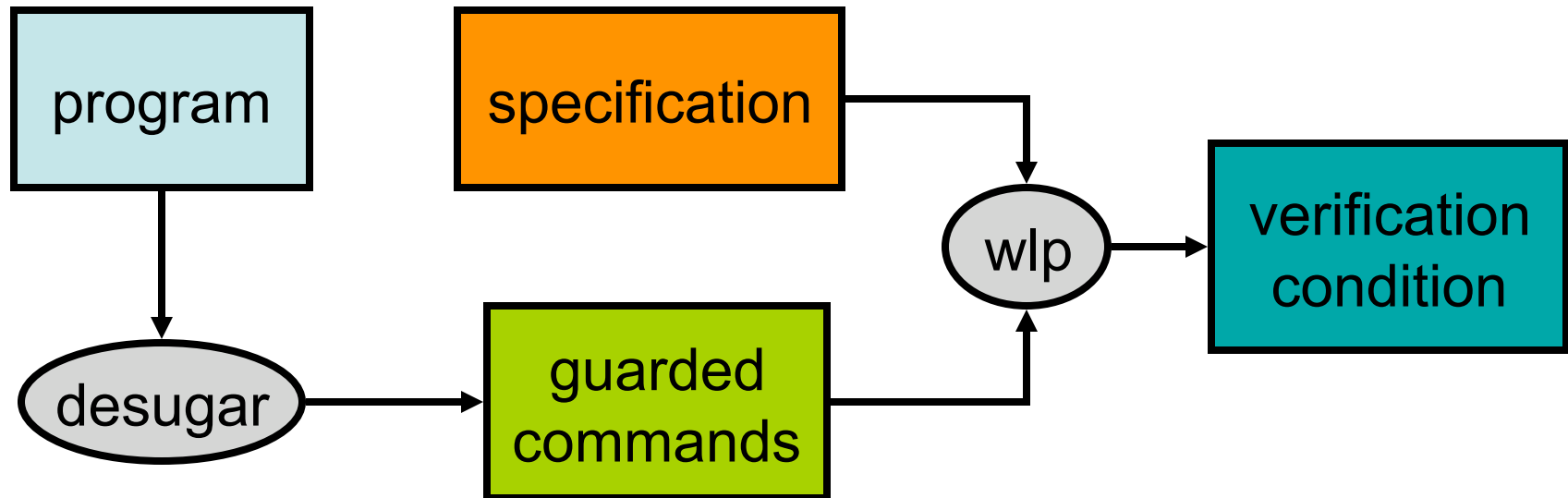
```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg$ ( $\exists v$ . (k0, v)  $\in$  content))" */
{
  int hc = compute_hash(k0);
  Node current = table[hc];
  while /*: inv " $\forall v$ . ((k0, v)  $\in$  content) = ((k0, v)  $\in$  current.bucketContent)" */
    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

## Source of Invariants

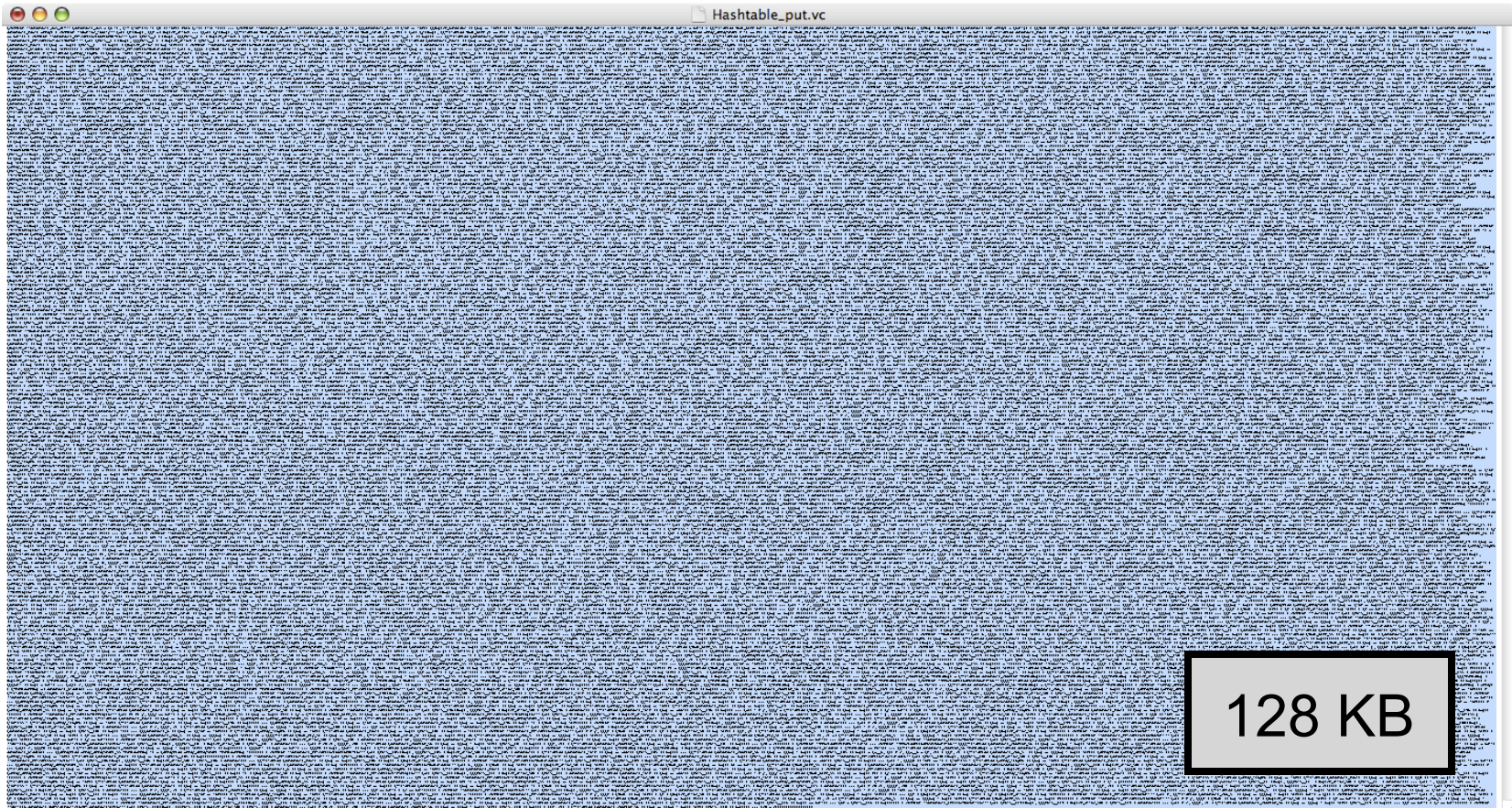
- Inferred by system
- Provided by developer
- Inferred by shape analysis

# Generating Verification Conditions

- Convert to guarded commands
- Apply weakest liberal pre-conditions



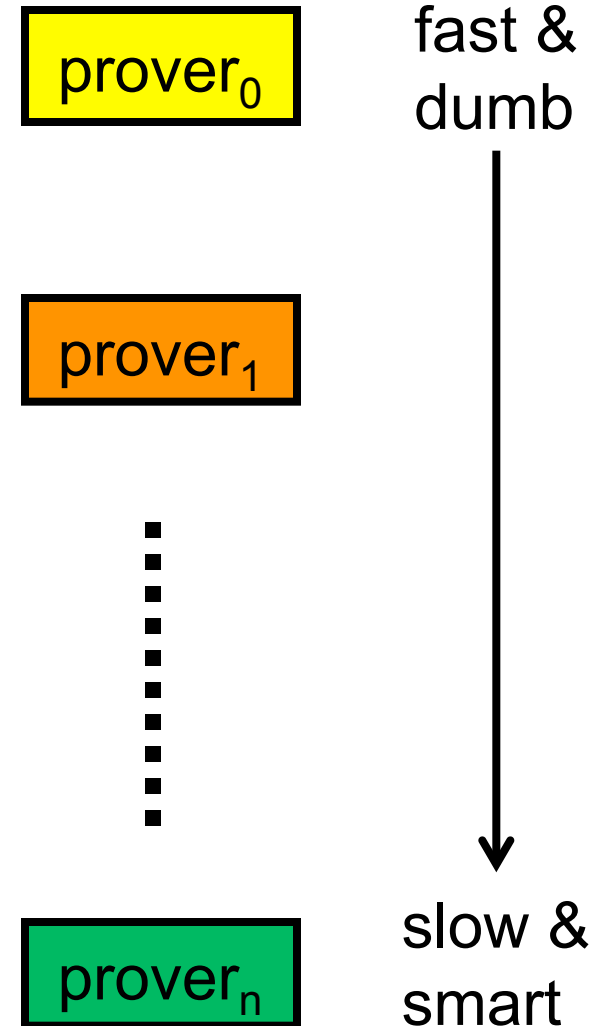
# Verification Condition for Hashtable.put



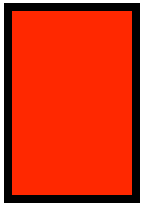
How to prove?

# Available Provers

- Syntactic provers
- Nelson-Oppen provers
- Resolution-based provers
- Decision procedures
  - Monadic second-order logic
  - BAPA
- Proof assistants







verification  
condition

prover<sub>0</sub>

prover<sub>1</sub>

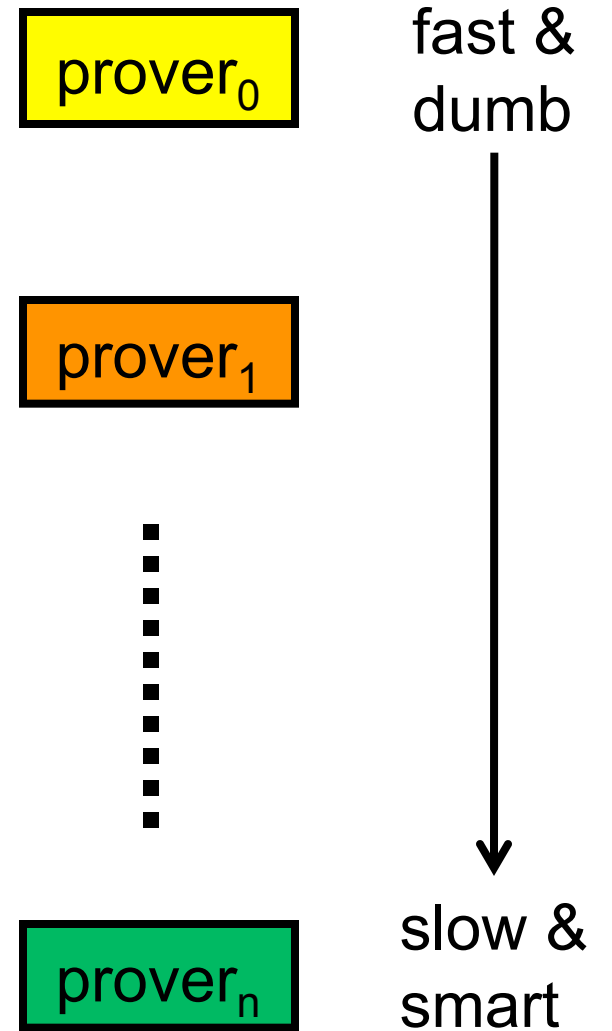
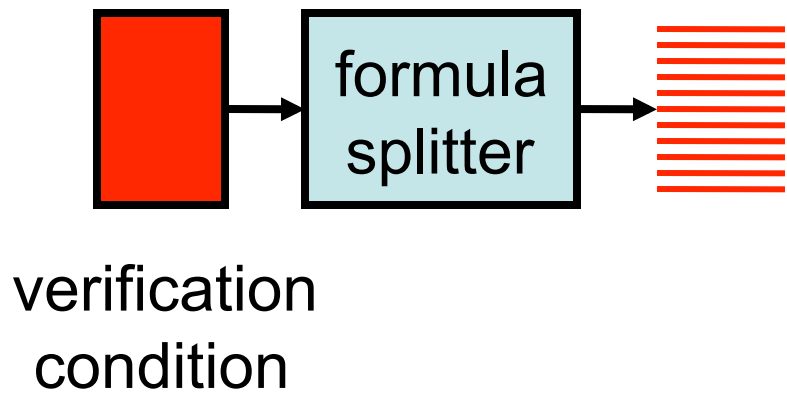


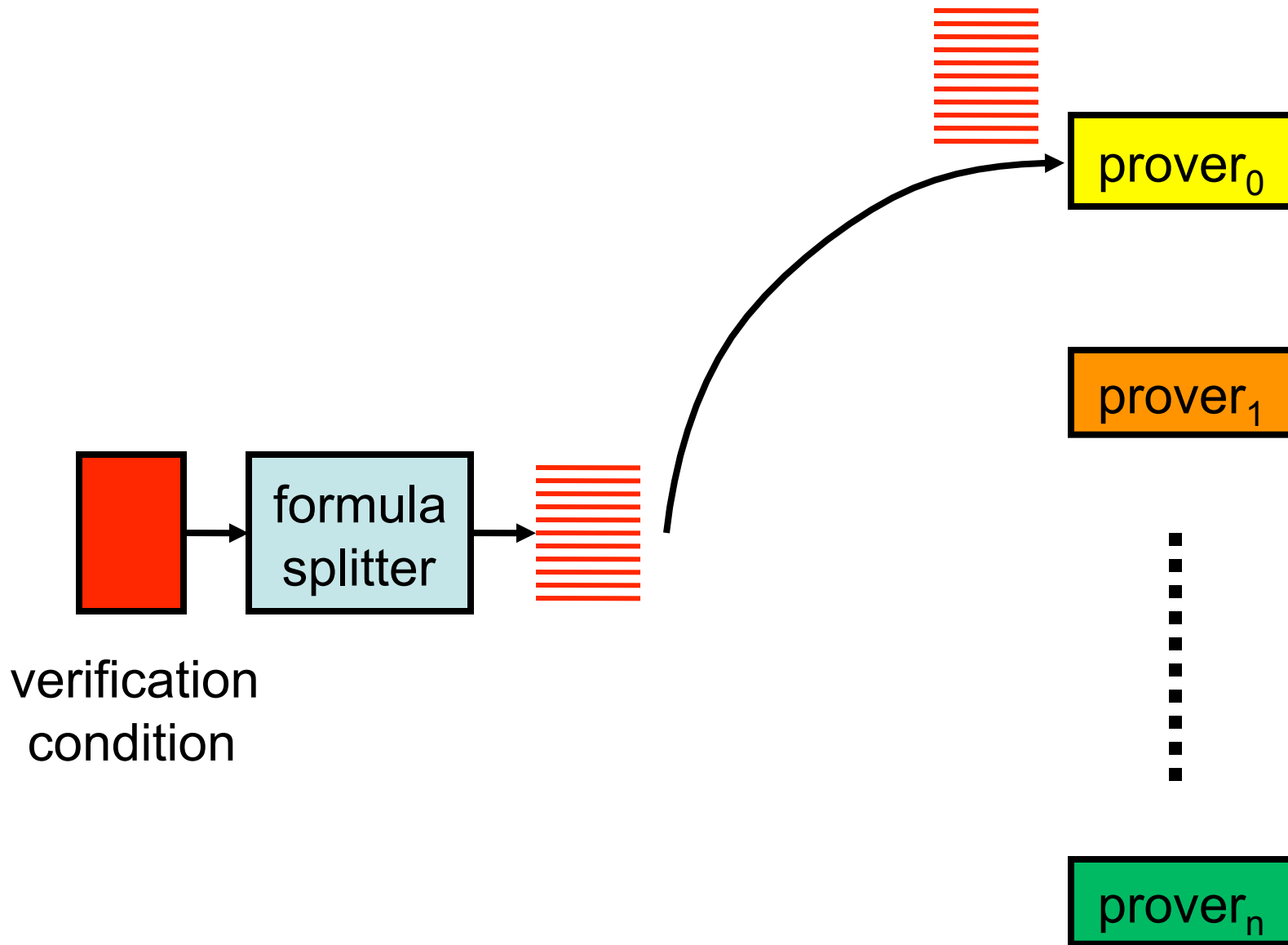
prover<sub>n</sub>

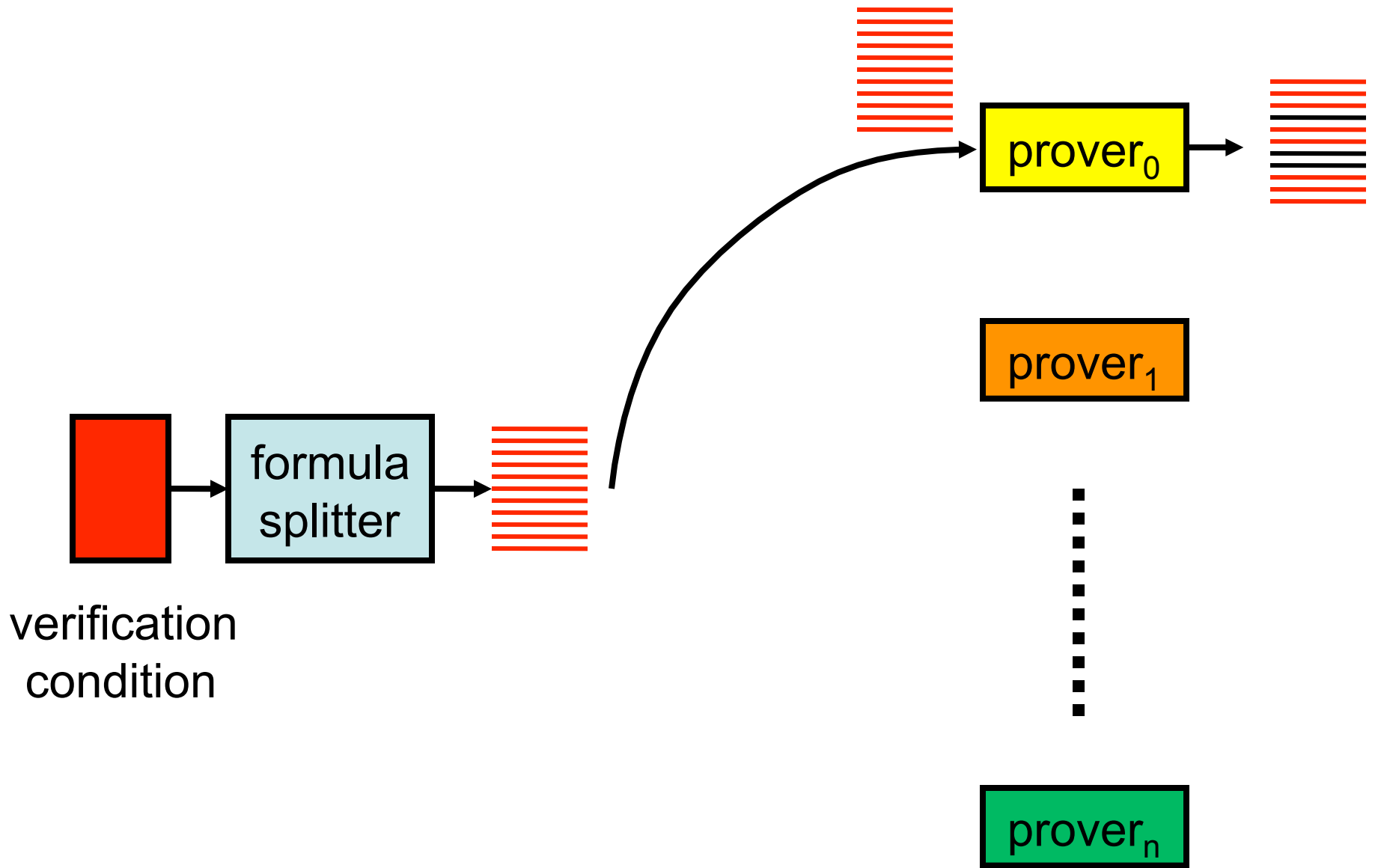
fast &  
dumb

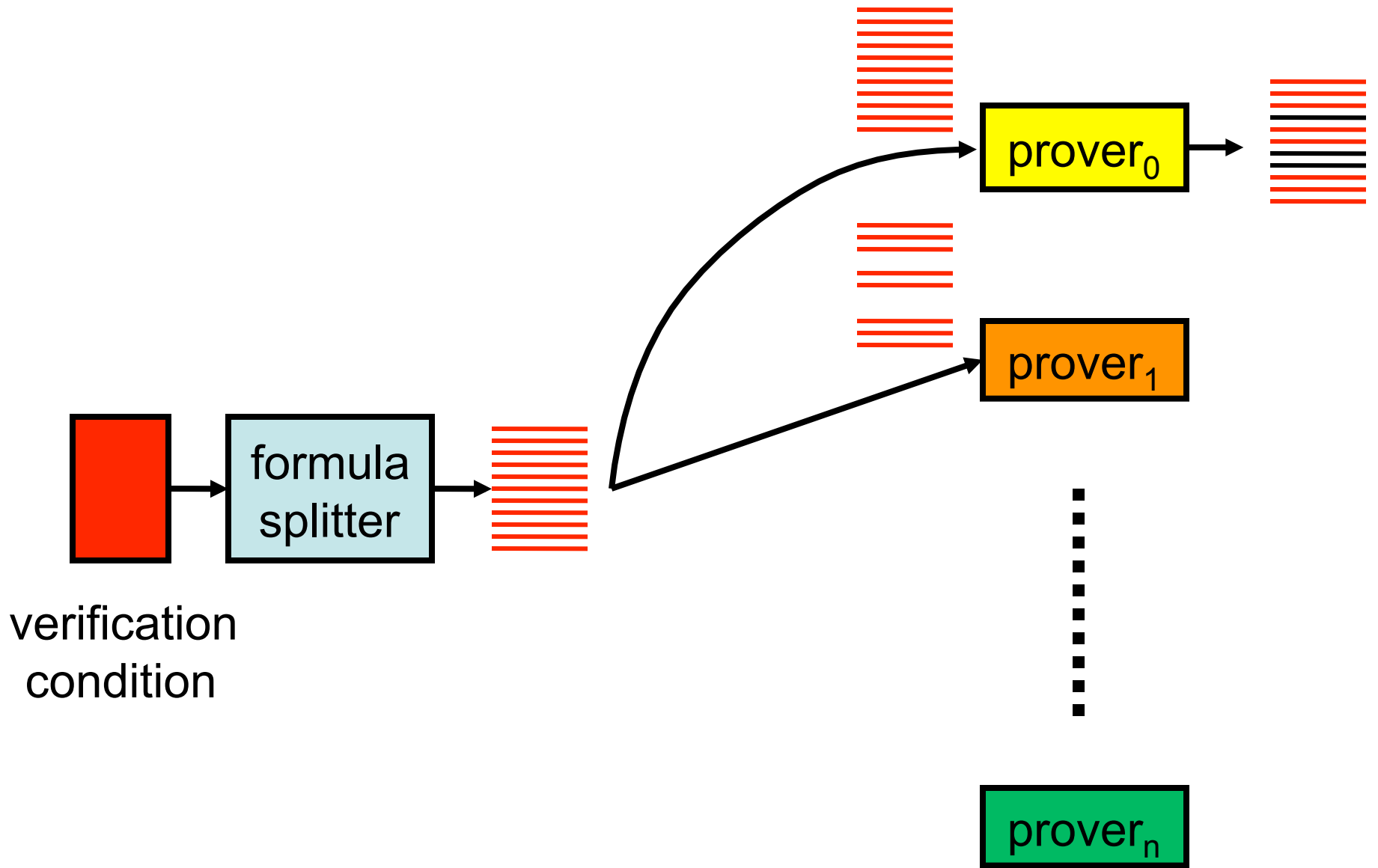


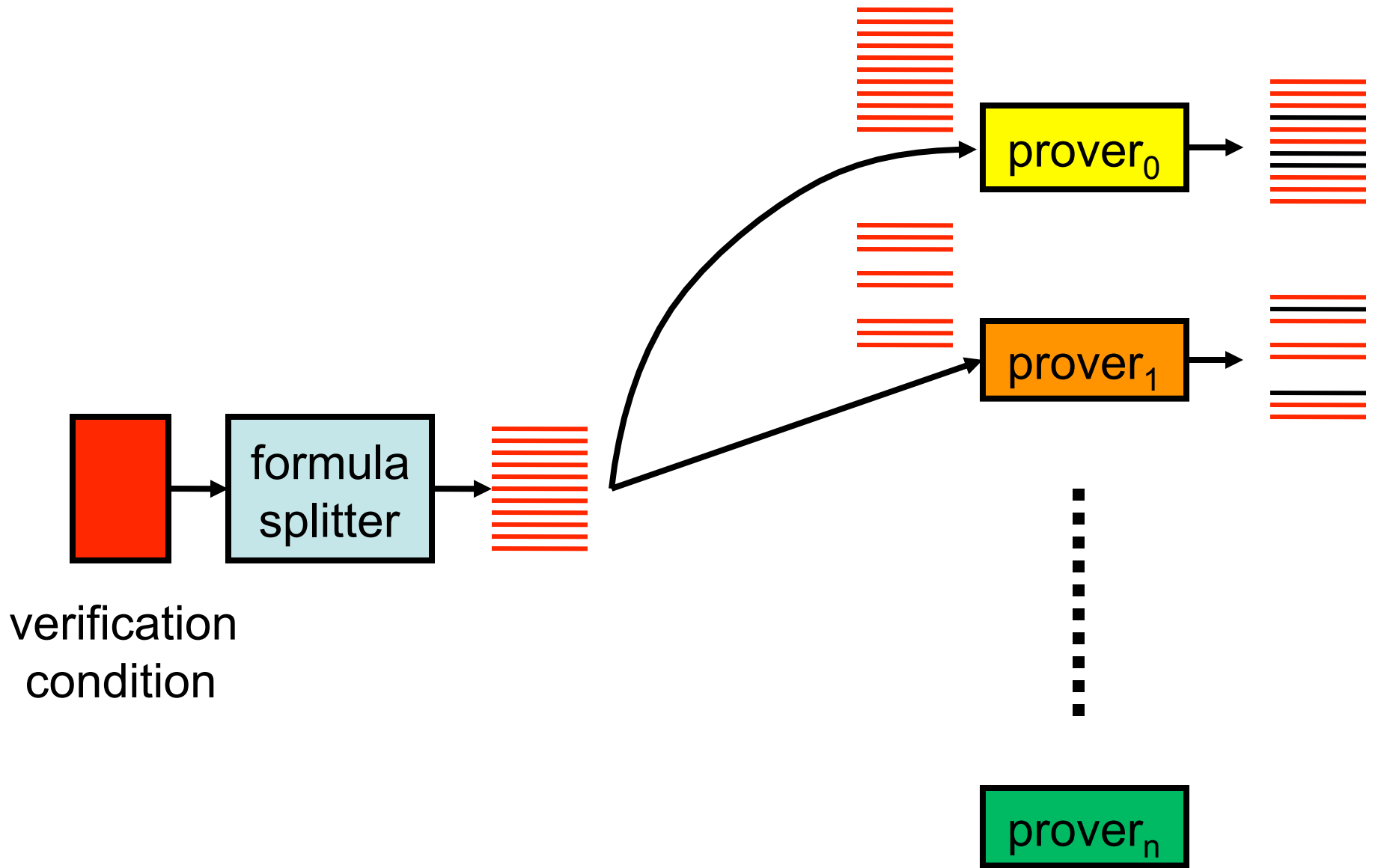
slow &  
smart

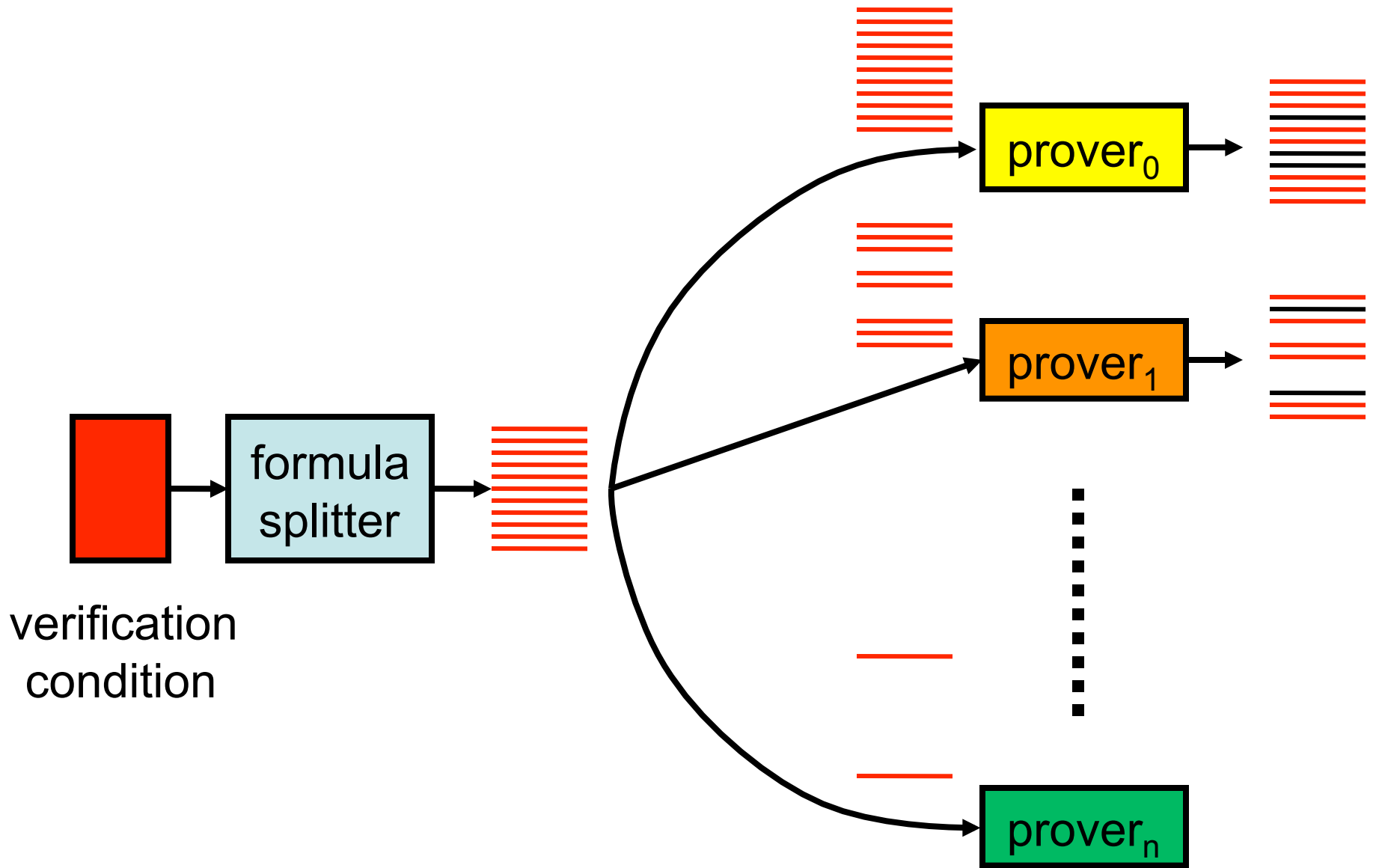


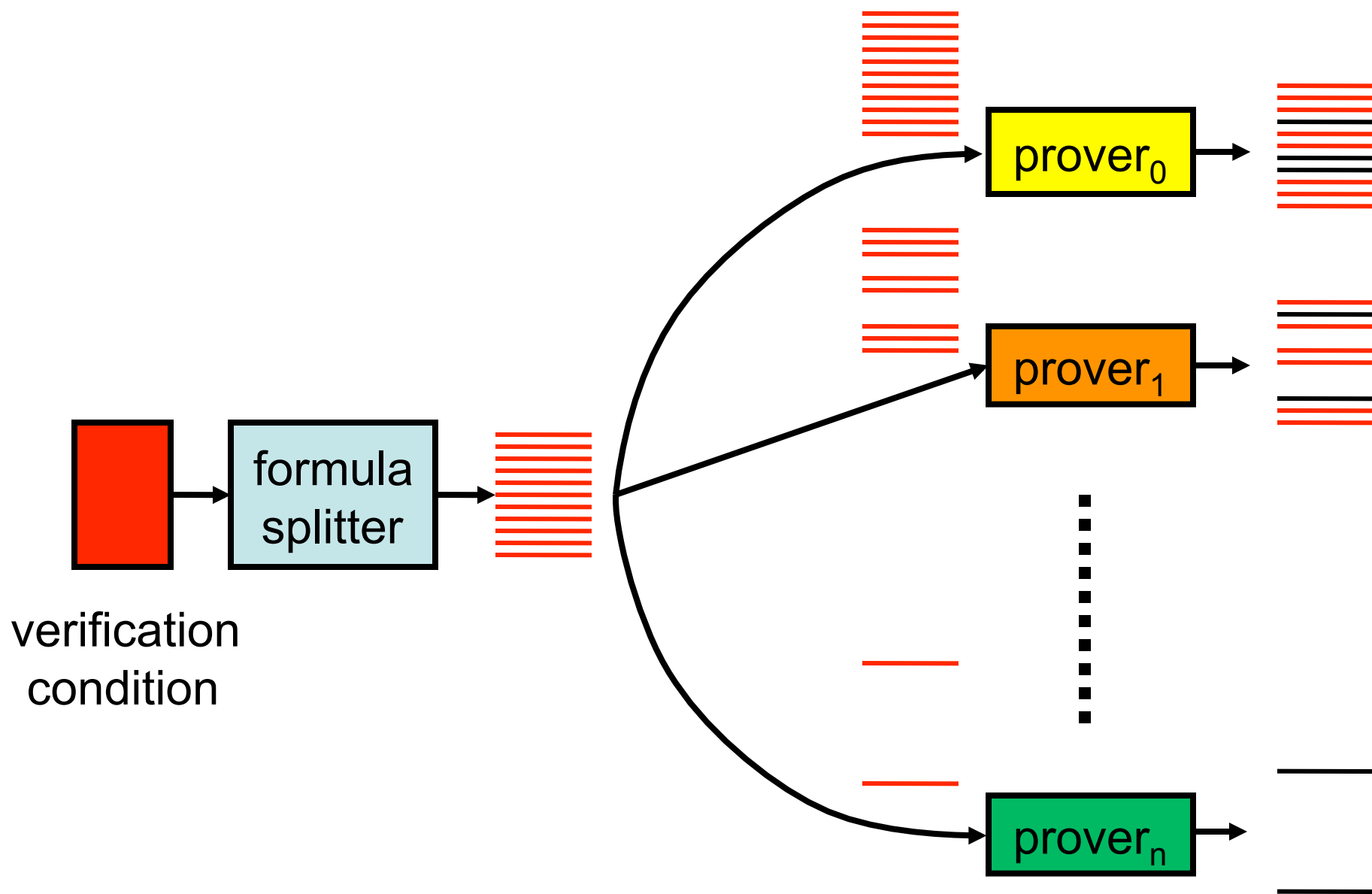




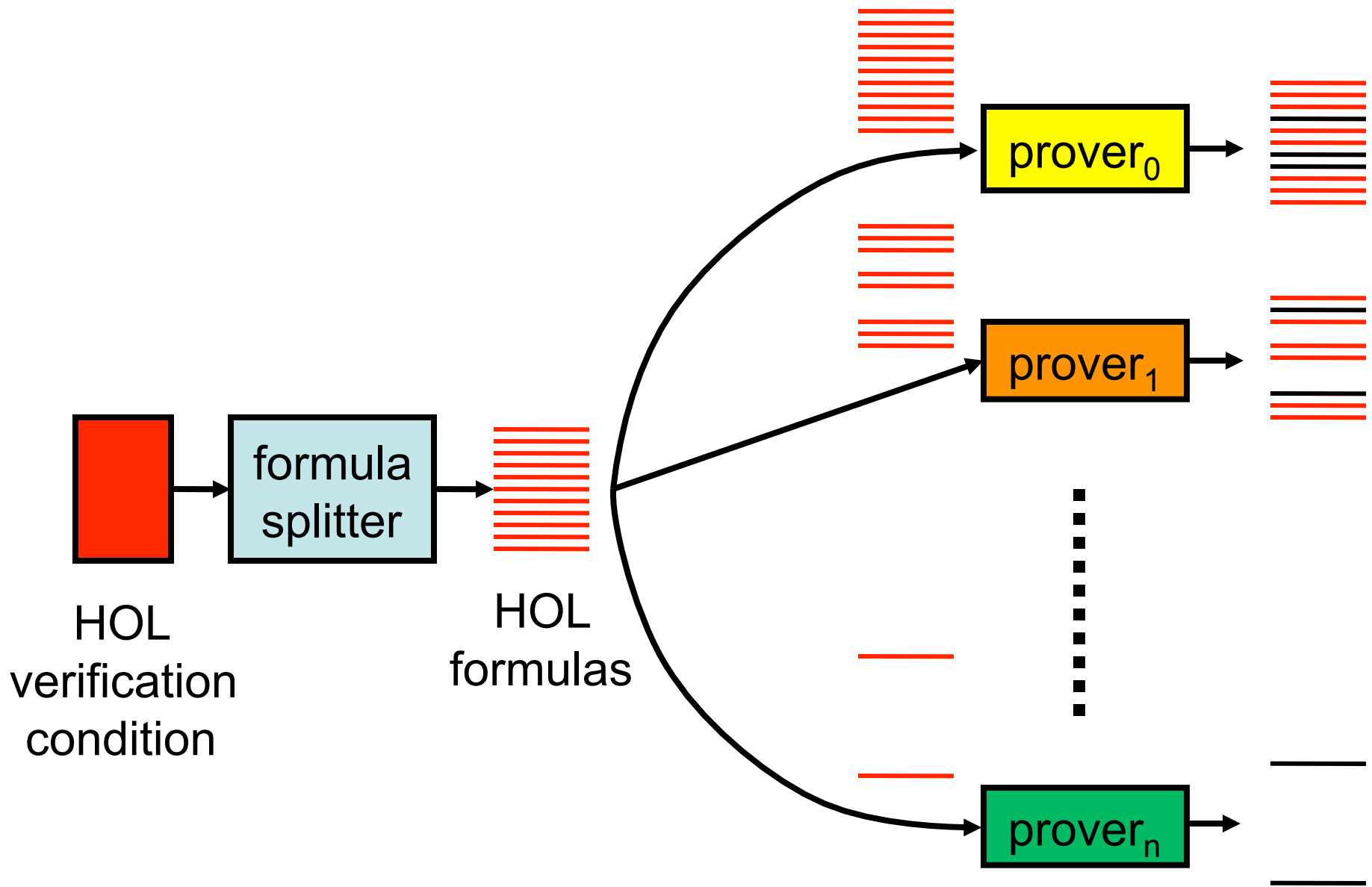


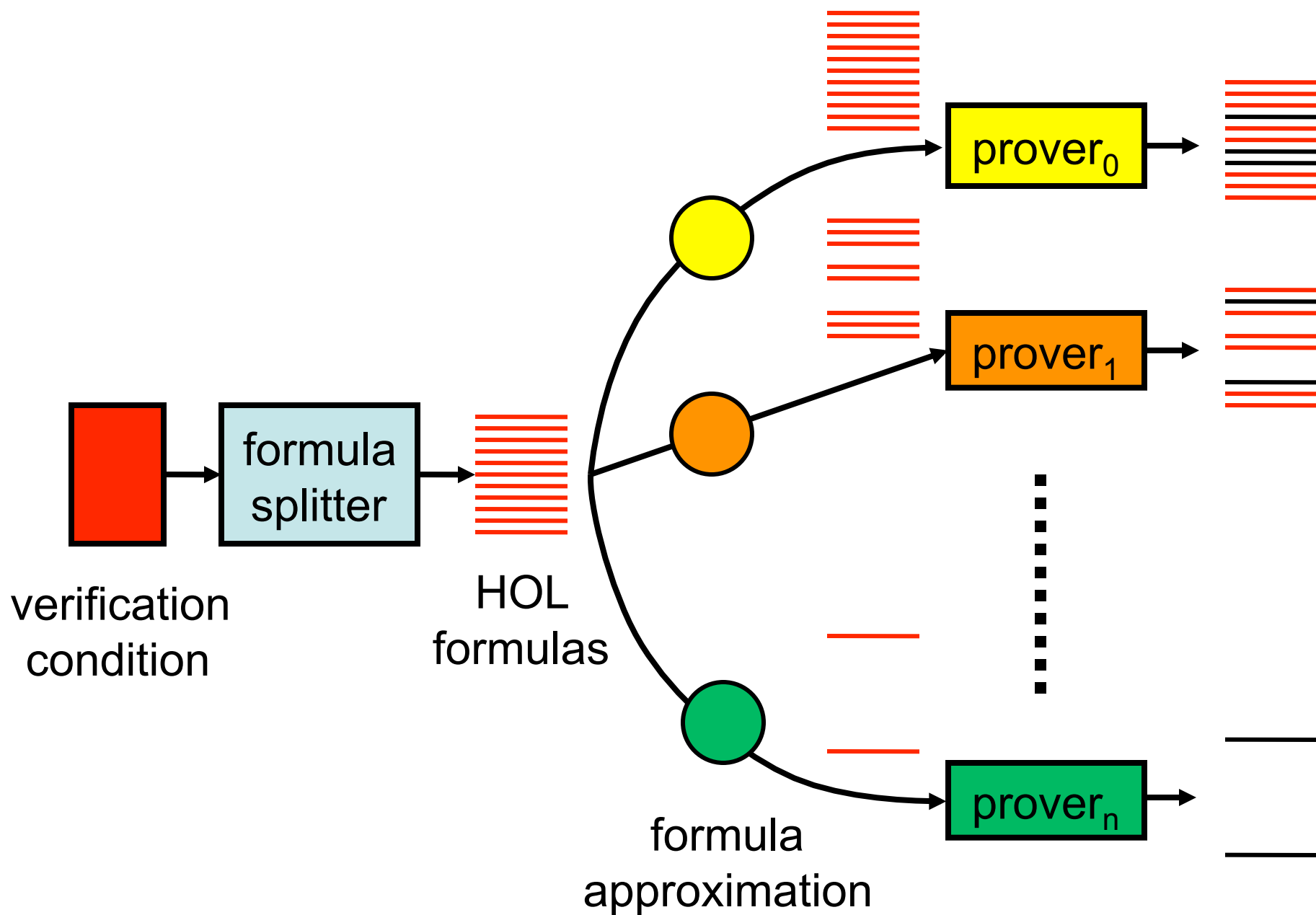


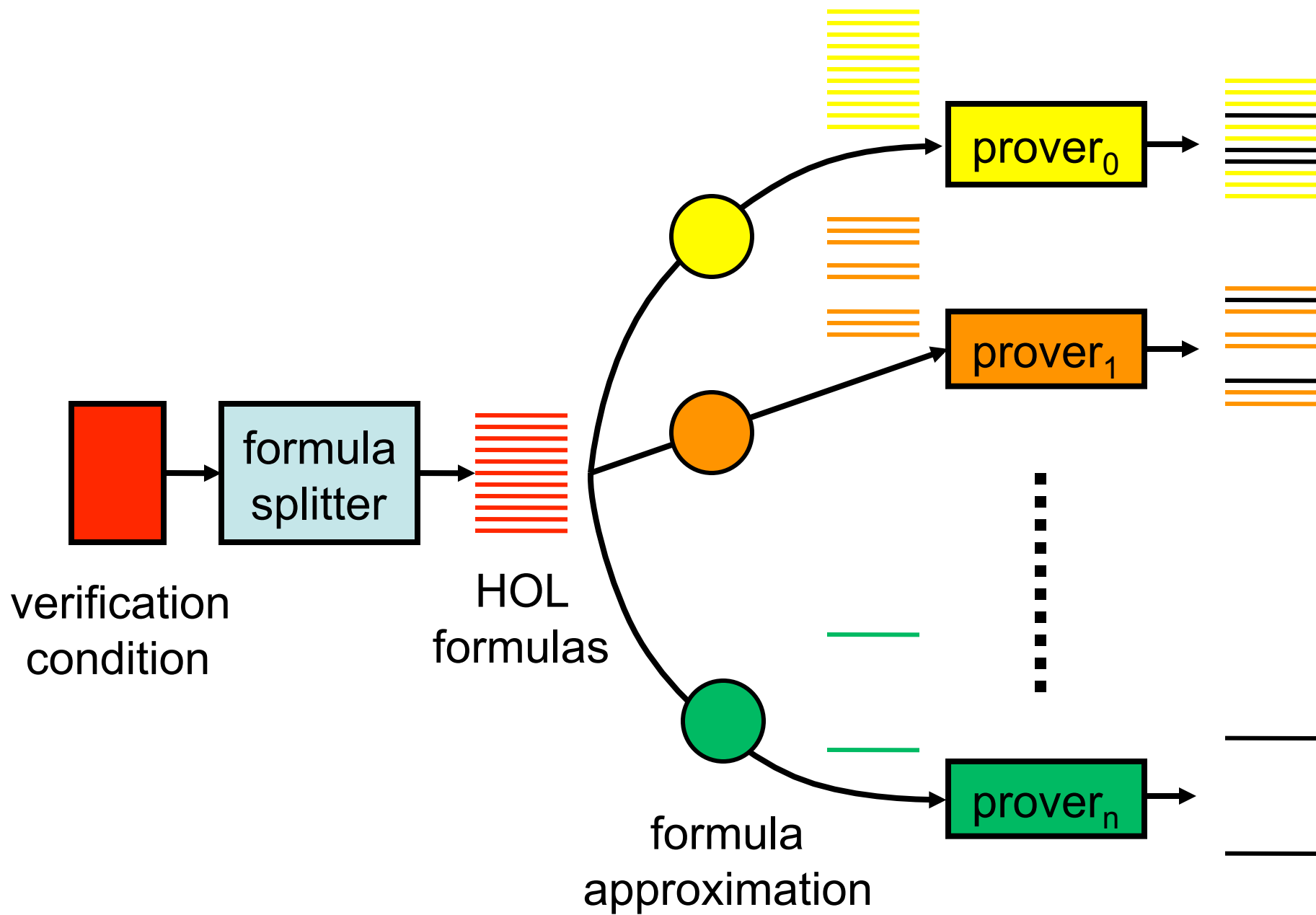




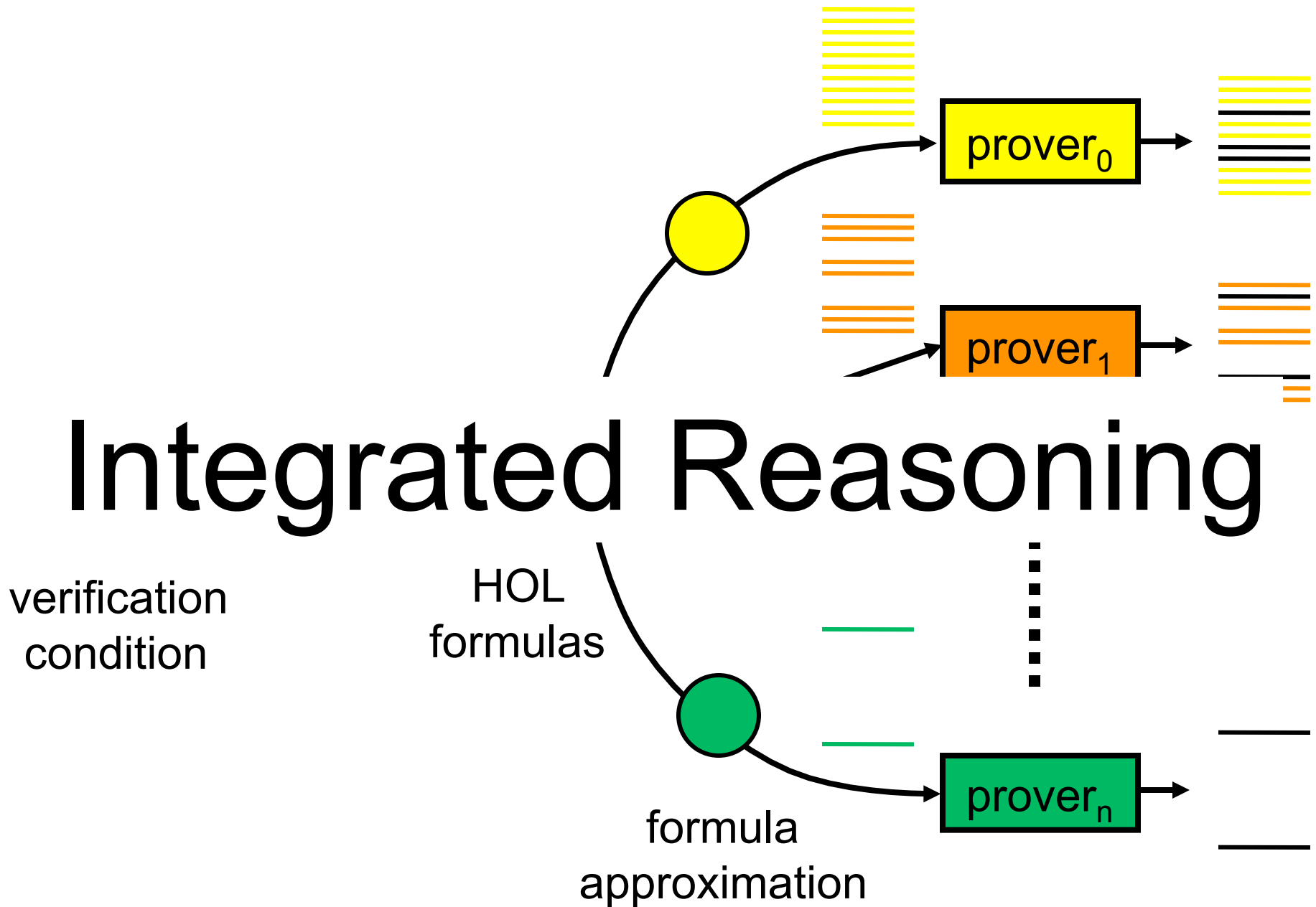




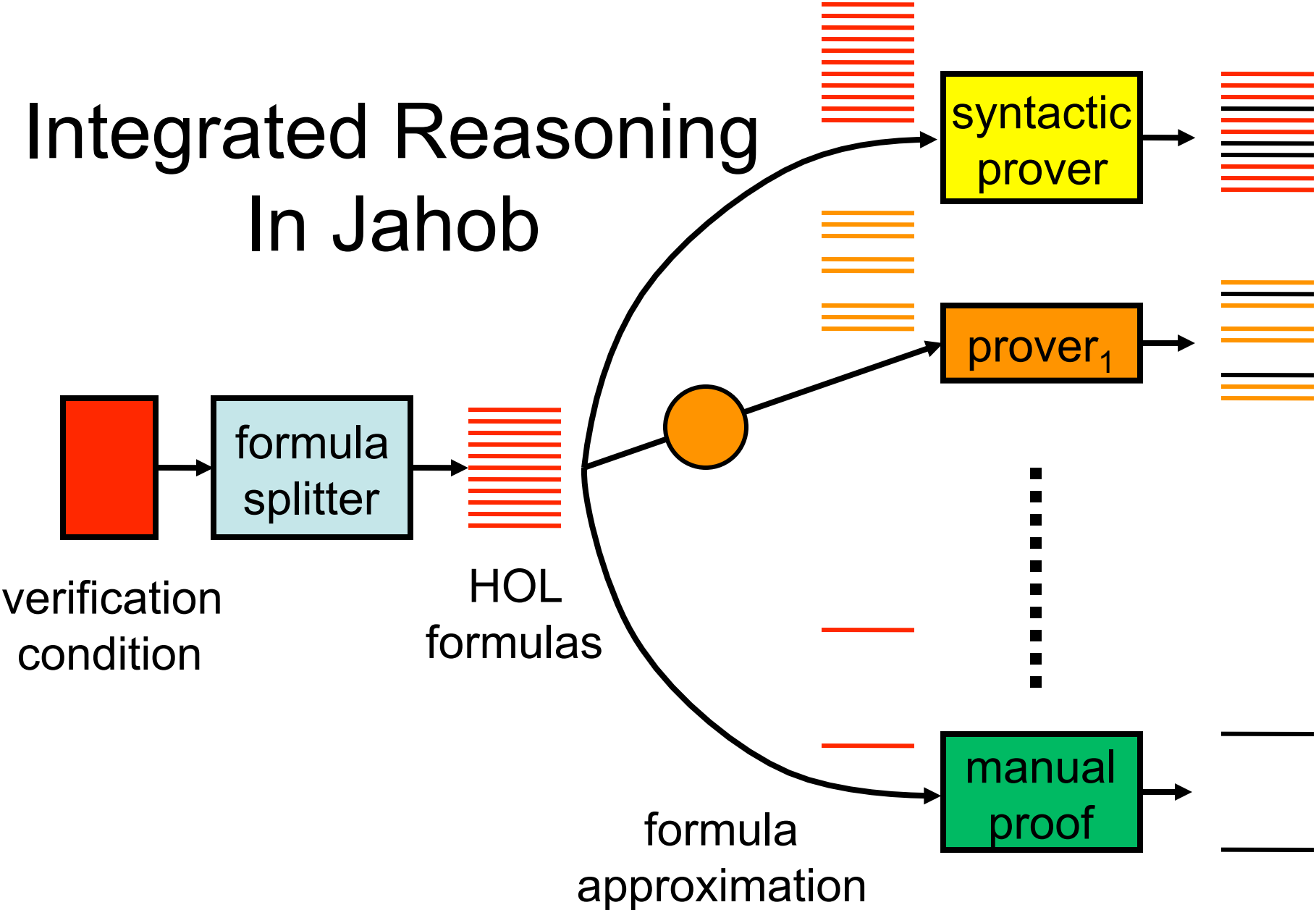




# Integrated Reasoning



# Integrated Reasoning In Jahob



# Formula Splitting

- Transform verification condition into equivalent conjunction of smaller formulas

$$\begin{array}{ll} A \rightarrow G_1 \wedge G_2 & \Rightarrow A \rightarrow G_1, A \rightarrow G_2 \\ A \rightarrow (B \rightarrow G^{[p]})^{[q]} & \Rightarrow (A \wedge B^{[q]}) \rightarrow G^{[pq]} \\ A \rightarrow \forall x. G & \Rightarrow A \rightarrow G[x:=x_{\text{fresh}}] \end{array}$$

- Enables application of different solvers to solve different parts of verification condition

# Formula Approximation

- Feed *any* formula to *any* prover or decision procedure
- Approximate given formula with a stronger formula in appropriate logic subset
- Translate constructs where possible
  - Transform set expressions to predicates
  - Apply beta-reduction to lambda expressions
  - Rewrite tuples into elements
  - Apply extensionality
- Approximate where necessary
  - Descend formula recursively
  - Approximate inexpressible subformulas according to arity

# Formula Approximation Rules

$\alpha : (0, 1) \times C$

$$\alpha^p(f_1 \wedge f_2) \equiv \alpha^p(f_1) \wedge \alpha^p(f_2)$$

$$\alpha^p(f_1 \vee f_2) \equiv \alpha^p(f_1) \vee \alpha^p(f_2)$$

$$\alpha^p(\neg f) \equiv \neg \alpha^{-p}(f)$$

$$\alpha^p(\forall x.f) \equiv \forall x.\alpha^p(f)$$

$$\alpha^p(\exists x.f) \equiv \exists x.\alpha^p(f)$$

$$\alpha^0(f) \equiv \text{false, for } f \text{ not representable in } C$$

$$\alpha^1(f) \equiv \text{true, for } f \text{ not representable in } C$$

$$\alpha^p(f) \equiv e, \text{ for } f \text{ directly representable in } C \text{ as } e$$



# Formula Approximation Rules

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# Why Does Formula Approximation Work?

- Formula splitting preserves assumptions
- Proof of a given subformula depends only on a subset of assumptions
- Some HOL formulas directly translatable into formulas in simpler logics

# Dealing With Proof Complexity

- Proof complexity issues
  - Provers overwhelmed by assumptions
  - Proof of a single subformula requires expertise of multiple provers
- Note statements
  - //: note f: “...” from  $f_0, f_1, \dots, f_n$ ;*
  - Tell provers which assumptions to use
  - Introduce intermediate lemmas into verification conditions
- In effect, developer guides proof decomposition

# Note Example (get)

```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg$ ( $\exists v. (k0, v) \in$  content))" */
{
  int hc = compute_hash(k0);
  Node current = table[hc];
  //: note ThisProps: "this  $\in$  old alloc  $\wedge$  this  $\in$  Hashtable  $\wedge$  this.init";
  //: note HCProps: "0  $\leq$  hc  $\wedge$  hc < table.length  $\wedge$  hc = hash key (table.length)";
  /*: note InCurrent: " $\forall v. ((k0, v) \in$  content) = ((k0, v)  $\in$  current.bucketContent)"
     from ContentDef, HCProps, Coherence, ThisProps, InCurrent; */
  while /*: inv " $\forall v. (k0, v) \in$  content) = ((k0, v)  $\in$  current.bucketContent" */
    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

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  int hc = compute_hash(k0);
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  //: note ThisProps: "this  $\in$  old alloc  $\wedge$  this  $\in$  Hashtable  $\wedge$  this.init";
  //: note HCPProps: "0  $\leq$  hc  $\wedge$  hc < table.length  $\wedge$  hc = hash key (table.length)";
  /*: note InCurrent: " $\forall v$ . ((k0, v)  $\in$  content) = ((k0, v)  $\in$  current.bucketContent)"
     from ContentDef, HCPProps, Coherence, ThisProps, InCurrent; */
  while /*: inv " $\forall v$ . (k0, v)  $\in$  content) = ((k0, v)  $\in$  current.bucketContent" */
    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

Label known facts

# Note Example (get)

```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg(\exists v. (k0, v) \in$  content))" */
{
  int hc = compute_hash(k0);
  Node current = table[hc];
  //: note ThisProps: "this  $\in$  old alloc  $\wedge$  this  $\in$  Hashtable  $\wedge$  this.init";
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    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

State proof goal  
(intermediate fact or final goal)



# Note Example (get)

```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg$ ( $\exists v$ . (k0, v)  $\in$  content))" */
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  int hc = compute_hash(k0);
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    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

Identify a set of known facts

# Note Example (get)

```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg$ ( $\exists v$ . (k0, v)  $\in$  content))" */
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  int hc = compute_hash(k0);
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    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

- Instruct prover to use set to prove goal
- Proven fact inserted into assumption base

# Note Example (get)

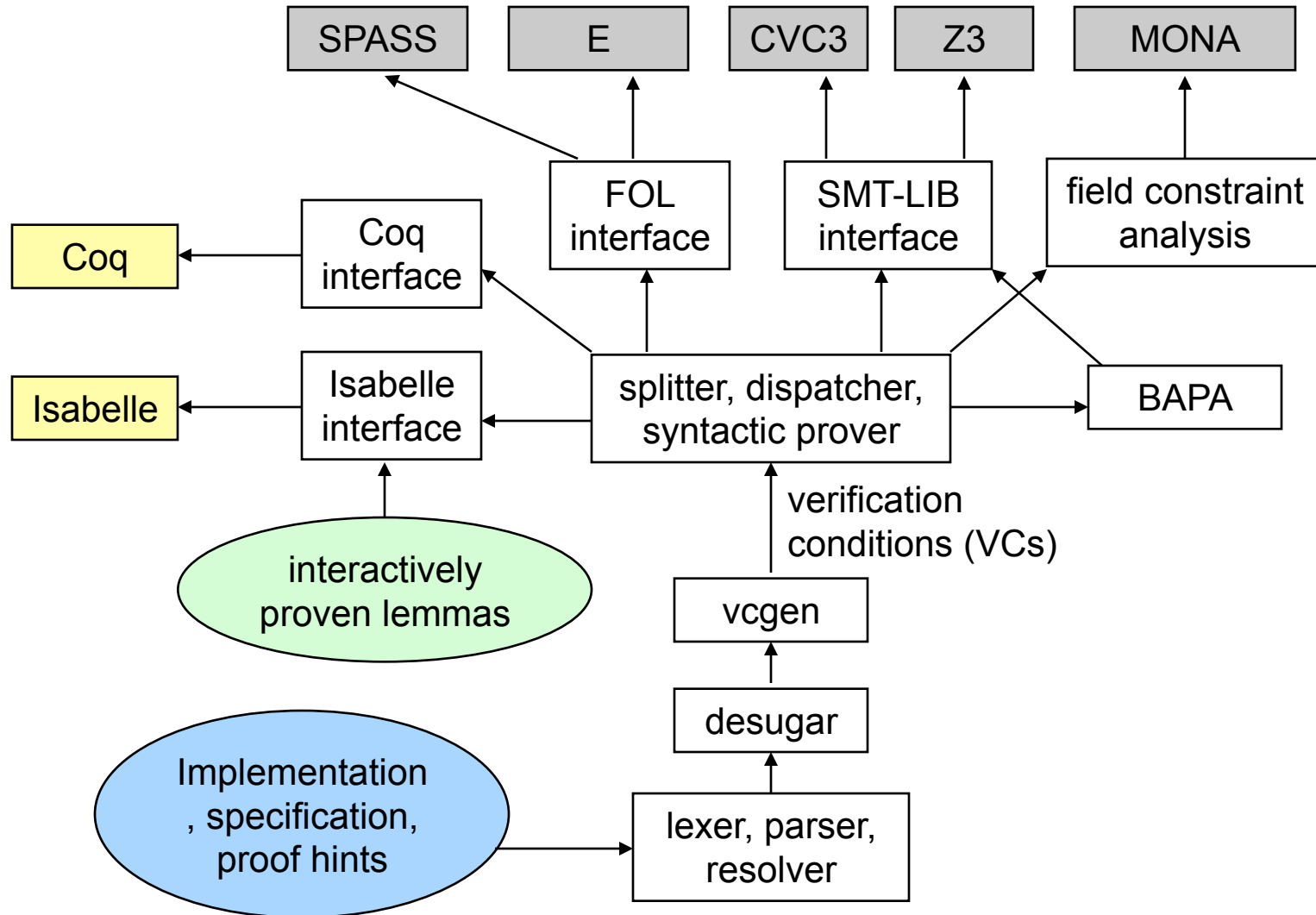
```
public Object get(Object k0)
/*: requires "init  $\wedge$  k0  $\neq$  null"
   ensures "(result  $\neq$  null  $\rightarrow$  (k0, result)  $\in$  content)  $\wedge$ 
   (result = null  $\rightarrow$   $\neg(\exists v. (k0, v) \in \text{content}))"$  */
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    (current != null) {
    if (current.key == k0) { return current.value; }
    current = current.next;
  }
  return null;
}
```

Proved trivially by  
syntactic prover

# Constructs for Directly Controlling Proof

- **havoc  $x_0, \dots, x_n$  suchThat f**  
Instantiates  $\exists x_0, \dots, x_n. f$
- **pickAny  $x_0, \dots, x_n$  in (c; note g)**  
Prove  $\forall x_0, \dots, x_n. g$
- **assuming f in ( $c_{\text{pure}}$ ; note g)**  
Prove  $f \rightarrow g$
- Desugar into standard guarded commands

# Jahob System Diagram



# Experimental Results

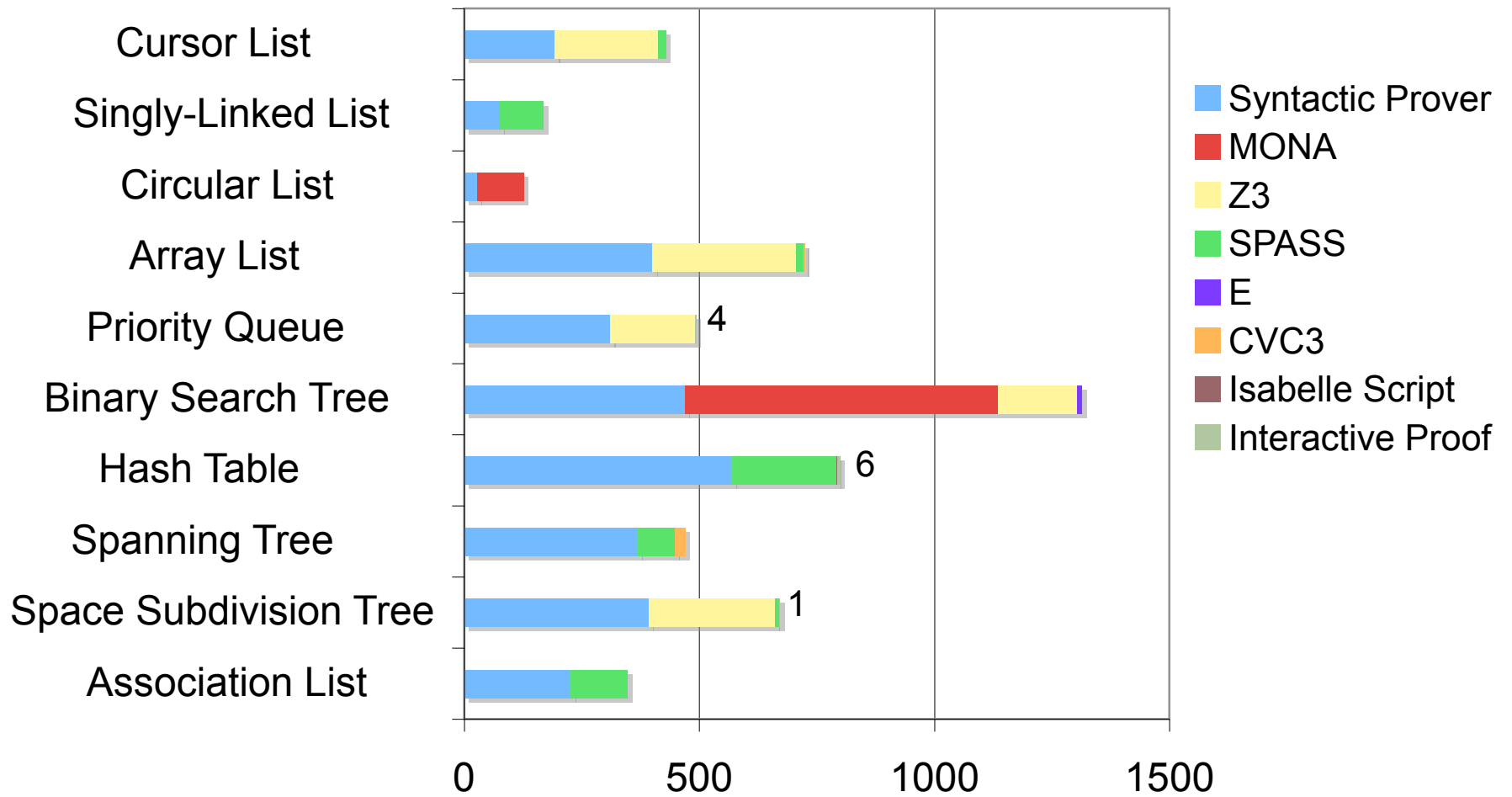
# Verified Data Structures

- Cursor List
- Singly-Linked List
- Circular List
- Array List
- Priority Queue
- Binary Search Tree
- Hash Table
- Spanning Tree
- Space Subdivision Tree
- Association List

# Provers

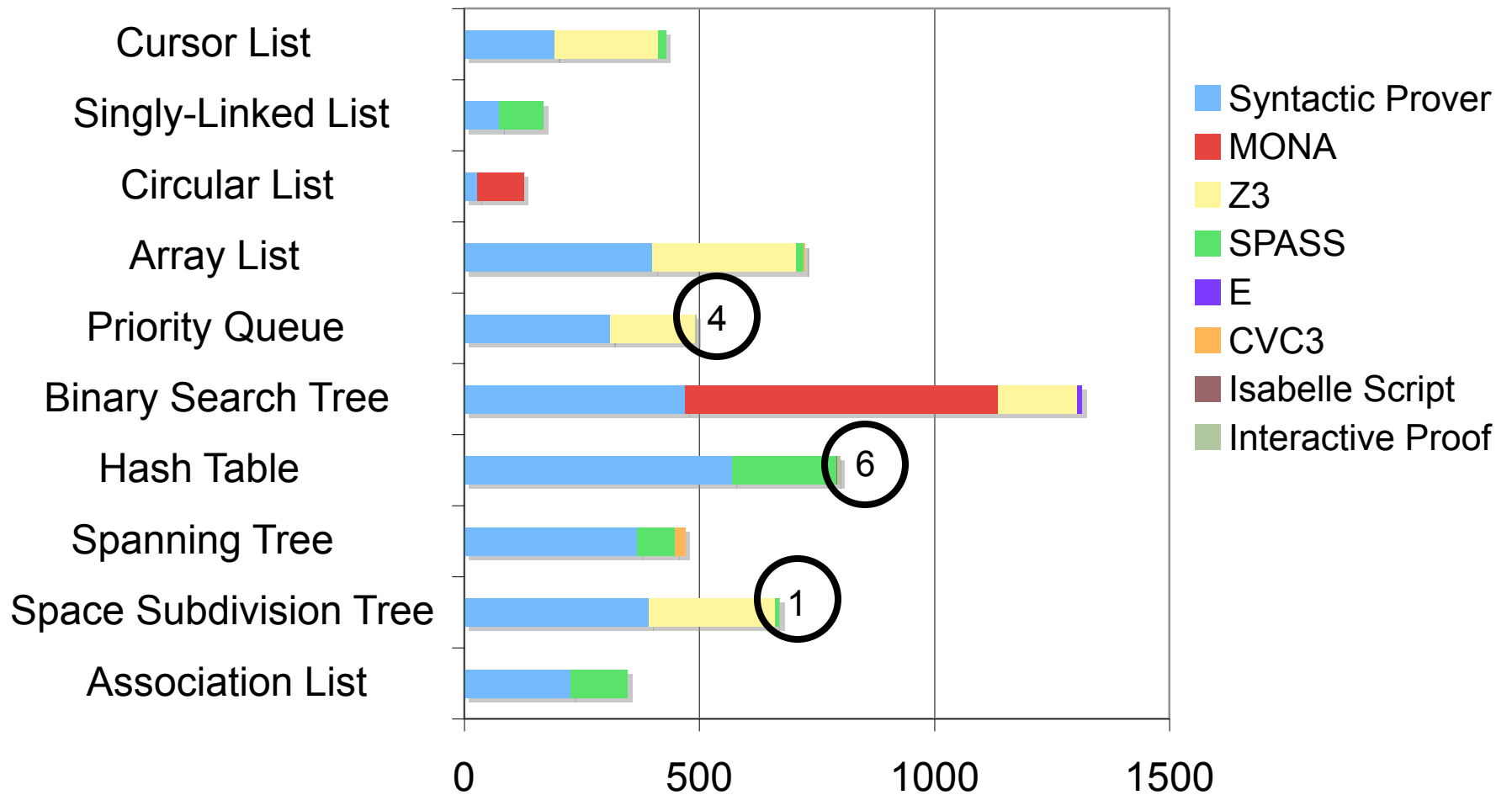
- Syntactic prover
- MONA
- Z3
- SPASS
- E
- CVC3
- Isabelle (simplifier)
- Isabelle proof assistant

# Formulas Verified

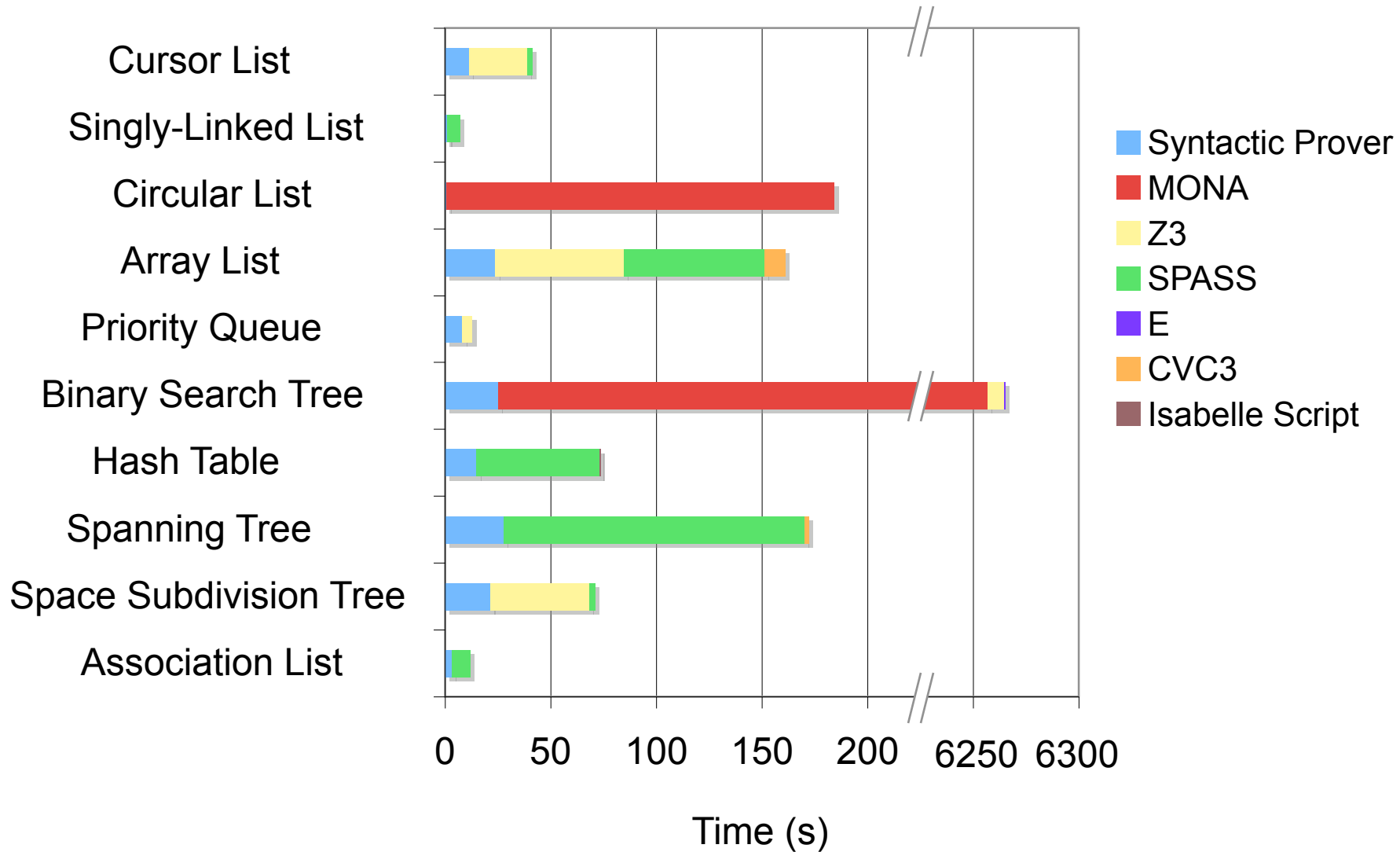




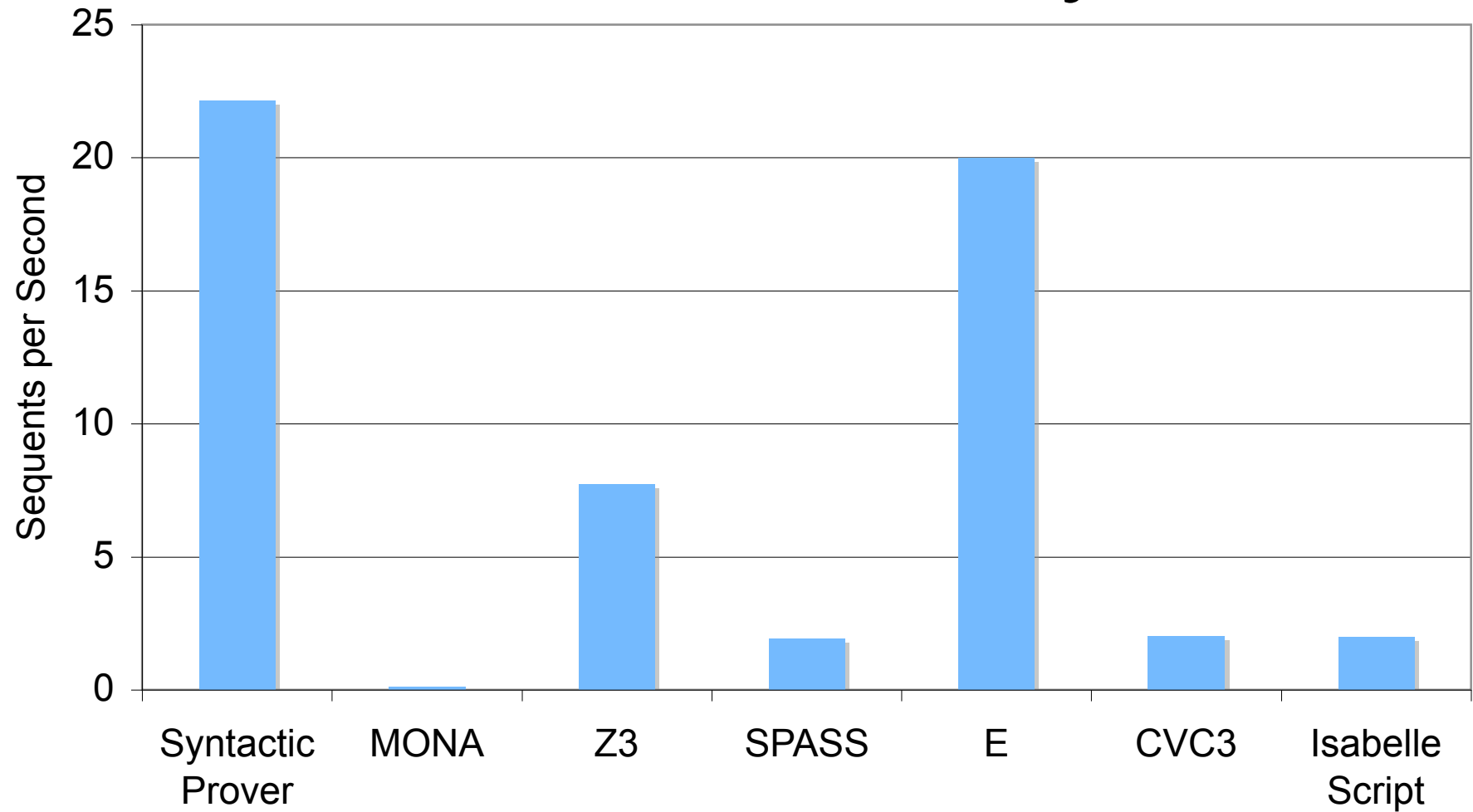
# Formulas Verified



# Verification Time



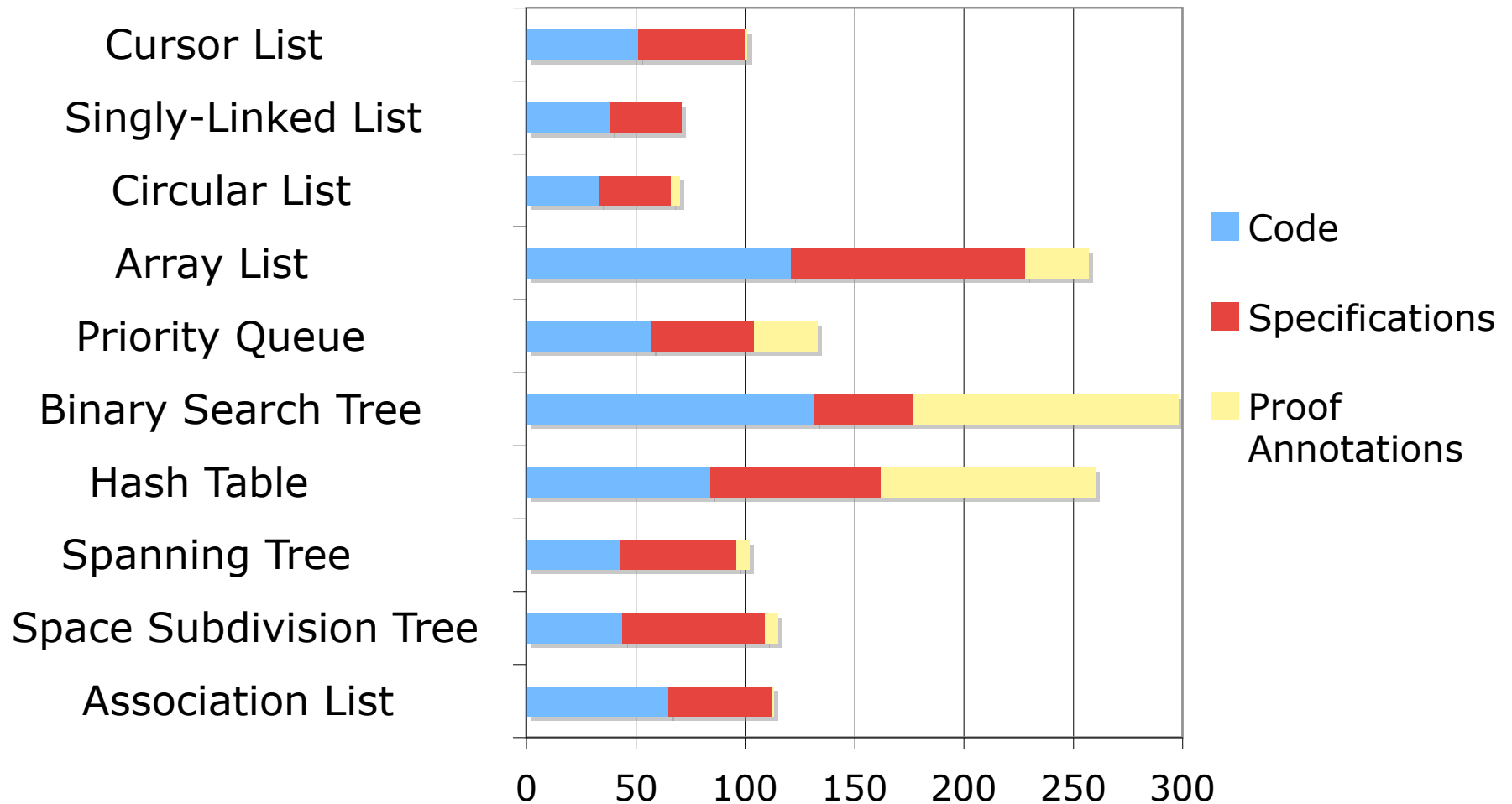
# Prover Efficiency



# Manual Proofs

- Space Subdivision Tree
  - 1 proof, 4 lines of proof script
  - 2 case splits, 1 quantifier instantiation
- Priority Queue
  - 2 proofs, 78 + 4 lines
  - Inductive proof with modulo arithmetic
- Hashtable
  - 1 proof for add, 7 lines, 3 case splits
  - 4 proofs for remove, 19 + 2 + 2 + 10 lines, case splits

# Logical Lines of Code



# Observations

- Implementation easier than specification  
(but more current expertise with implementation)
- Easy to prove – callers, observer methods
- Difficult to prove
  - Destructive update (constructors\*, add, remove\*)
  - Leaf methods (reasoning about concrete + abstract state)
- Incentive to decompose larger methods
- Incentive to reuse existing methods
- Must understand why implementation is correct to obtain proof

# Implications

- Verified data structure libraries
- Integrated reasoning in other contexts
- New program analysis techniques
  - Client analyses based on sets and relations (no more reasoning about pointers)
  - More precise data structure analyses
- Semantic commutativity analysis for parallel programs

# Related Work: Hob

- Kuncak, Lam, Zee, and Rinard [TSE 2006]; Lam [PhD. Thesis MIT 2007]
- Sets summarize data structure state
- Full functional verification only for data structures with set interface
- Multiple decision procedures (early form of integrated reasoning)



# Related Work (cont'd)

## Software Verification Tools

- Spec#: Barnett, DeLine, Fähndrich, Leino, and Schulte [J. Obj. Tech. 2004]
- ESC/Modula-3: Detlefs, Leino, Helson, Saxe [TR159 COMPAQ SRC 1998]
- ESC/Java: Flanagan, Leino, Lilibridge, Nelson, Saxe and Stata [PLDI 2002]
- ESC/Java: Chalin, Hurlin, and Kiniry [VSTTE 2005]
- Krakatoa: Filliatre [J. Func. Programming 2003]; Marche, Paulin-Mohring, and Urbain [J. Logic & Alg. Prog. 2003]
- KIV: Balsler, Reif, Schellhorn, Stenzel, and Thums [FASE 2000]
- KeY: Ahrendt, Baar, Beckert, Bubel, Giese, Hähnle, Menzel, Mostowski, Roth, Schlager, and Schmitt [Soft. & Sys. Modeling 2005]
- LOOP: van der Berg and Jacobs [TR CSI-R0019 U. Nijmegen 2000]

# Related Work (cont'd)

## Shape Analysis

- Chong and Rugina [SAS 2003]
- Role analysis: Kuncak, Lam, and Rinard [POPL 2002]
- Grammar-based shape analysis: Lee, Yang, and Ki [ESOP 2005]
- TVLA: Sagiv, Reps, and Wilhelm [TOPLAS 2002]
- Symbolic shape analysis: Podelski and Wies [SAS 2005]
- Guo, Vachharajani, and August [PLDI 2007]

## Separation Logic

- Smallfoot: Berdine, Calcagno, and O'Hearn [FMCO 2005]
- Nguyen, David, Qin, and Chin [VMCAI 2007]
- Nguyen and Chin [CAV 2008]
  
- Yang, Lee, Berdine, Calcagno, Cook, Distefano, and O'Hearn [CAV 2008]

# Unrelated Work

## Bounded model checking

- Bogor: Robby, Rodríguez, Dwyer and Hatcliff [STTT 2006]
- JACK: Bouali, Gnesi and Larosa [EATCS 1994]
- Forge: Dennis, Chang and Jackson [ISSTA 2006]
- J-Sim: Sobeih, Mahesh, Marinov and Hou [IPDPS 2007]

## Testing

- Korat: Boyapati, Khurshid and Marinov [ISSTA 2002]
- TestEra: Khurshid and Marinov [Autom. Soft. Eng. 2004]
- Cute: Sen, Marinov and Agha [FSE 2005]

# Conclusions

- Full functional correctness for linked data structure implementations
  - Formula splitting
  - Formula approximation
  - Integrated reasoning
  - Constructs for guiding proofs
- Complete realization of abstract data types
  - Precise, complete, and verified specifications
  - Enables new, more precise and scalable client program analyses

Questions?