

Conjecturing, Testing and Reasoning about Programs

Workshop on Verification and Program Transformation
27 March 2021

Moa Johansson, Chalmers University of Technology



CHALMERS
UNIVERSITY OF TECHNOLOGY

Introduction:

Theory Exploration

- **Discover interesting properties** about programs.
- **Build type-correct terms.**
(start small, only non-redundant!)
- **Test & evaluate** on ground values.
- **Assemble equations.**
(send to prover if you want)
- Use as lemmas, rewrite rules, equational specification...



Demo: Prove my homework

Or how to automate a CS undergraduate

```
fun sorted :: "nat list  $\Rightarrow$  bool"  
  where "sorted [] = True"  
  | "sorted [x] = True"  
  | "sorted (x1#x2#xs) = ((x1  $\leq$  x2)  $\wedge$  sorted (x2#xs))"  
  
fun ins :: "nat  $\Rightarrow$  nat list  $\Rightarrow$  nat list"  
  where "ins x [] = [x]"  
  | "ins x (y#ys) = (if (x  $\leq$  y) then (x#y#ys) else y#(ins x ys))"  
  
fun isort :: "nat list  $\Rightarrow$  nat list"  
  where "isort [] = []"  
  | "isort (x#xs) = ins x (isort xs)"  
  
theorem my_homework: "sorted (isort x)"
```


Demo: Prove my homework

First attempt: call Sledgehammer

```
theorem my_homework: "sorted (isort x)"  
sledgehammer
```

```
Sledgehammering...
```

```
"cvc4": Timed out
```

```
"vampire": Timed out
```

Sorted.thy (~/Desktop/)

SidekickStateTheories

```
fun sorted :: "nat list ⇒ bool"
  where "sorted [] = True"
  | "sorted [x] = True"
  | "sorted (x1#x2#xs) = ((x1 ≤ x2) ∧ sorted (x2#xs))"

fun ins :: "nat ⇒ nat list ⇒ nat list"
  where "ins x [] = [x]"
  | "ins x (y#ys) = (if (x ≤ y) then (x#y#ys) else y#(ins x ys))"

fun isort :: "nat list ⇒ nat list"
  where "isort [] = []"
  | "isort (x#xs) = ins x (isort xs)"

theorem my_homework: "sorted (isort x)"
  sledgehammer

end
```

☐ Proof state ☒ Auto update

Update

Search:

100%

Sledgehammering...

"cvc4": Timed out

"vampire": Timed out

Demo: Prove my homework

Six lemmas found and proved

lemma_a: $\text{sorted } (\text{ins } x \ y) \implies \text{sorted } y$

lemma_aa: $\text{sorted } y \implies \text{sorted } (\text{ins } x \ y)$

Key lemma

lemma_ab: $\text{ins } y \ (\text{ins } x \ z) = \text{ins } x \ (\text{ins } y \ z)$

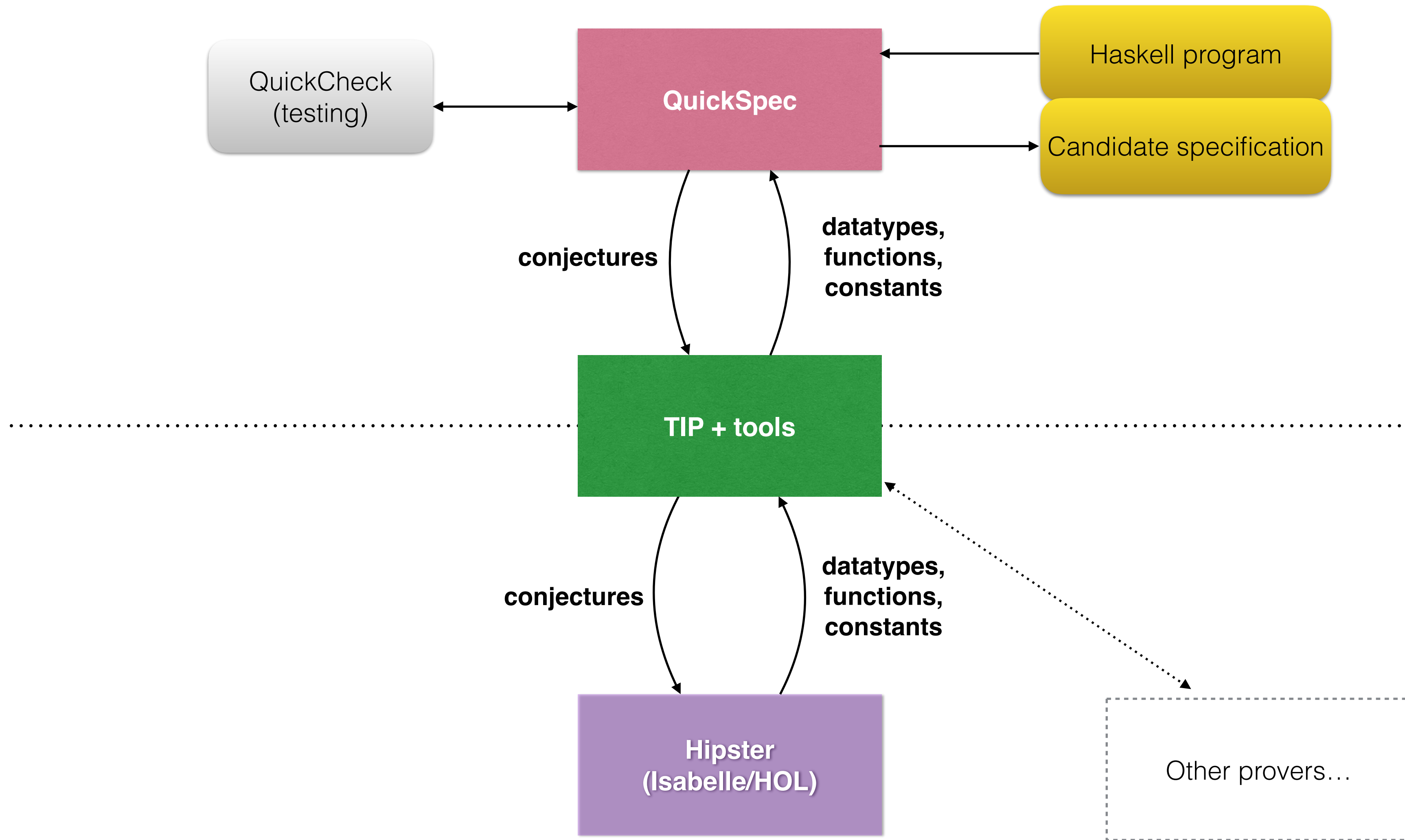
lemma_ac: $\text{sorted } (\text{isort } x)$
(Needs lemma_aa *)*

Our homework
assignment

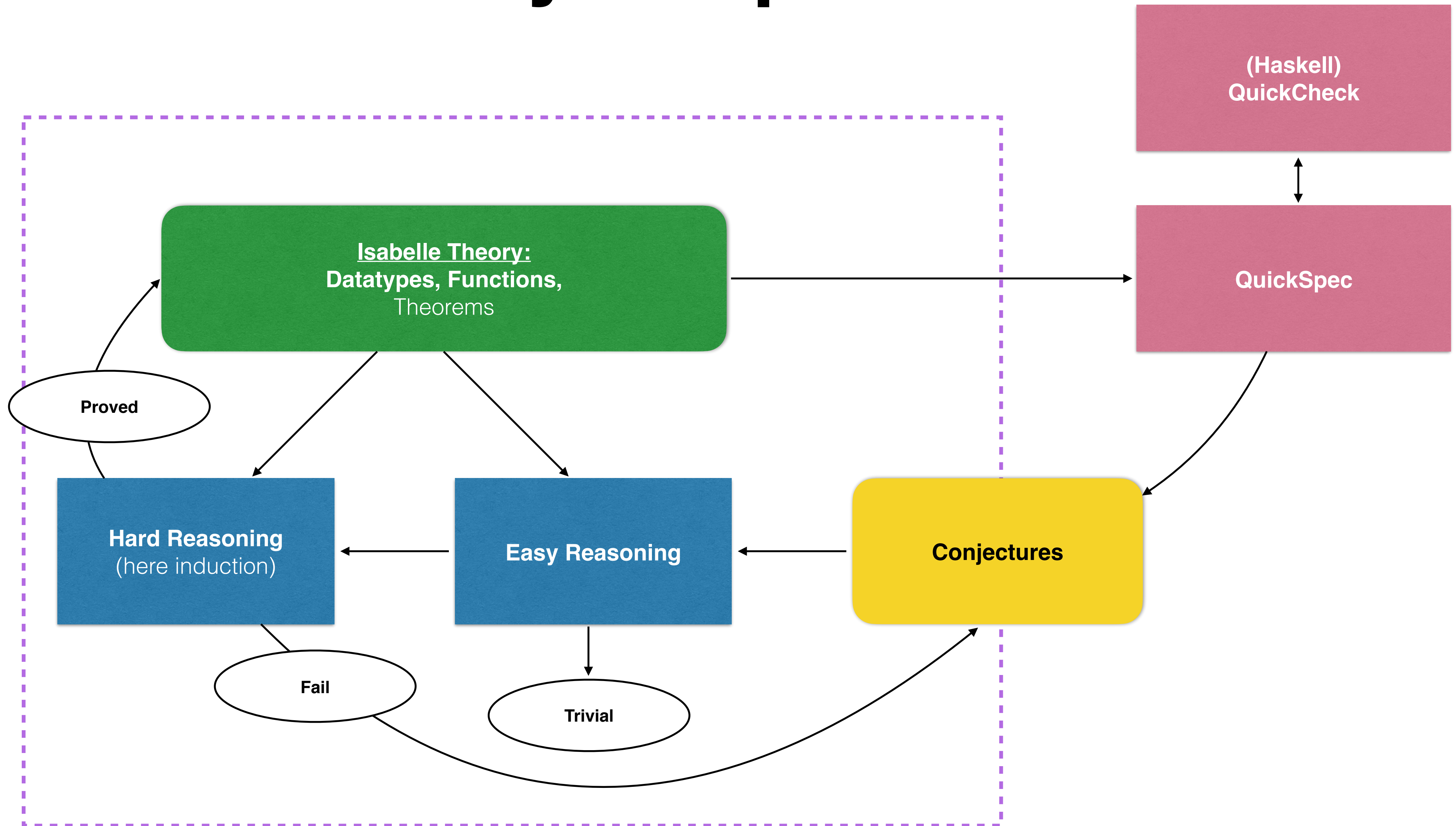
lemma_ad: $\text{"isort } (\text{ins } x \ y) = \text{ins } x \ (\text{isort } y)\text{"}$
(Needs lemma_ab *)*

lemma_ae: $\text{"isort } (\text{isort } x) = \text{isort } x\text{"}$
(Needs lemma_ad *)*

Architecture



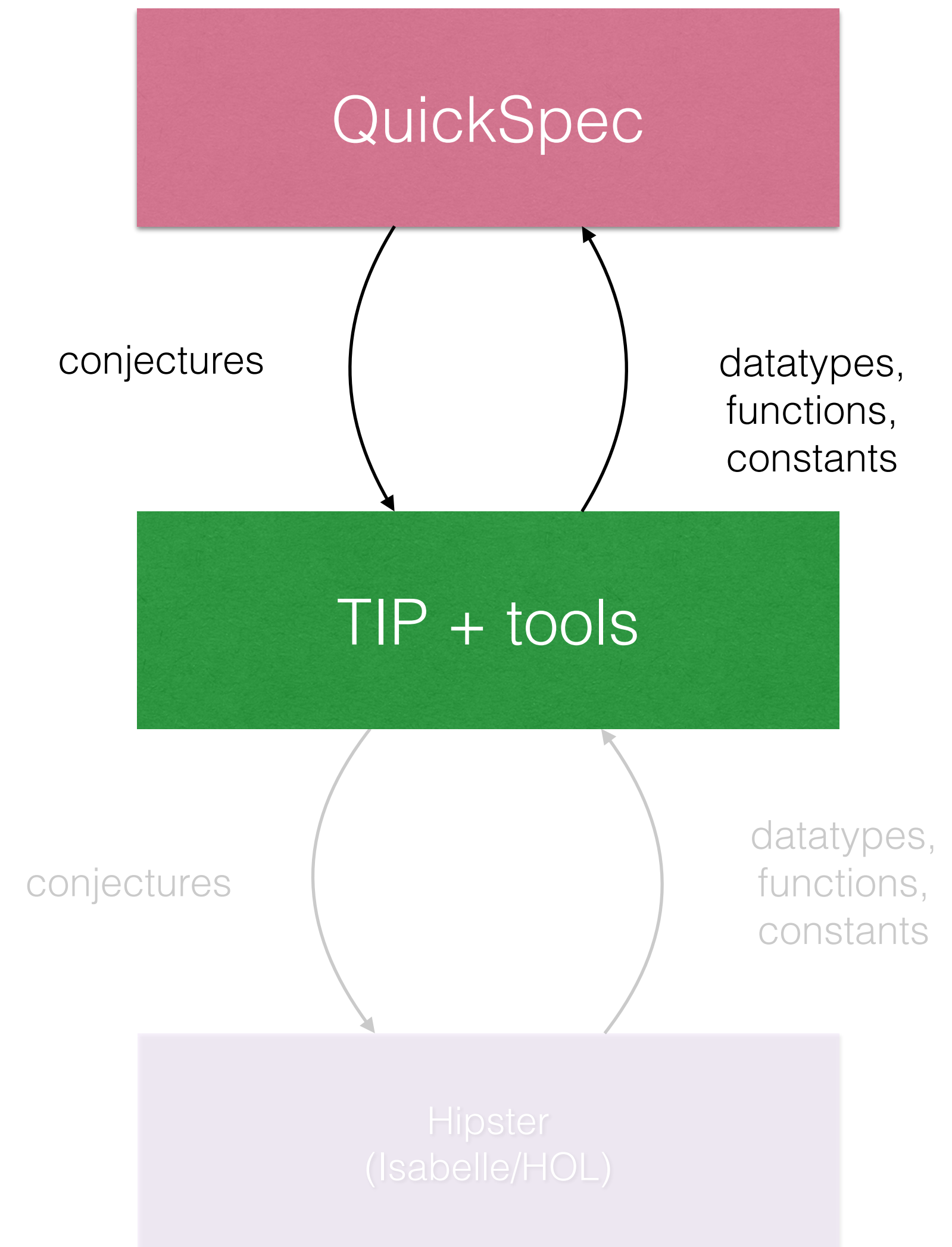
Theorem Discovery in Hipster

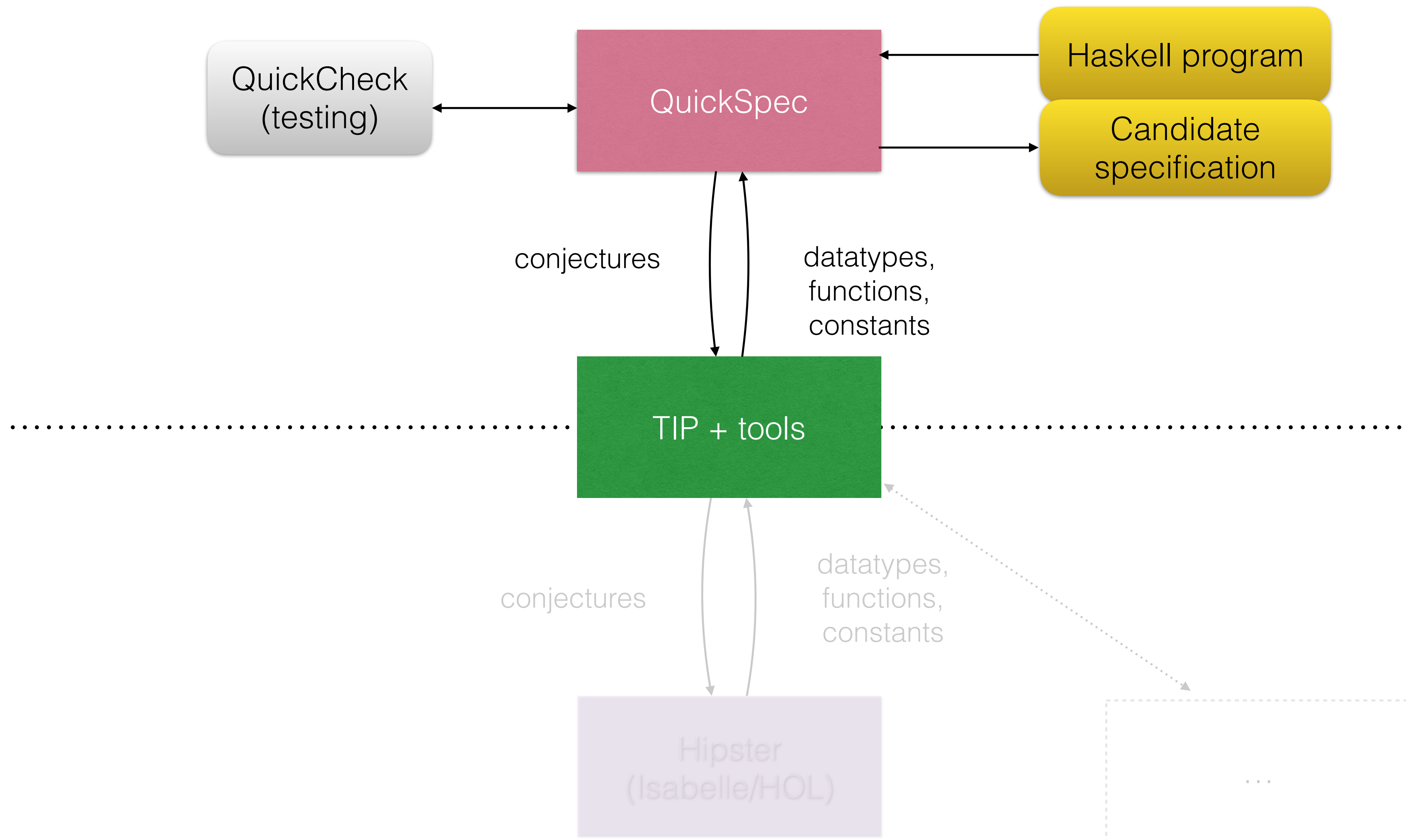


TIP

Middle layer

- Intermediate language based on SMT-LIB
 - Datatypes, recursive functions, pattern matching
- Translation tools to various formats, e.g. standard SMT-LIB.
- Libraries for writing pretty-printers and parsers





How QuickSpec works

(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1]$

$ys \rightarrow []$

xs

reverse (reverse xs)

sort xs

sort (reverse xs)

sort (xs++ys)

How QuickSpec works

(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1]$

$ys \rightarrow []$

xs

reverse (reverse xs)

sort xs

sort (reverse xs)

sort (xs++ys)

[2, 1]

reverse (reverse [2, 1])

sort [2, 1]

sort (reverse [2, 1])

sort ([2, 1] ++ [])

How QuickSpec works

(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1]$

$ys \rightarrow []$

xs	$[2, 1]$	$[2, 1]$
$\text{reverse (reverse } xs)$	$\text{reverse (reverse } [2, 1])$	$[2, 1]$
$\text{sort } xs$	$\text{sort } [2, 1]$	$[1, 2]$
$\text{sort (reverse } xs)$	$\text{sort (reverse } [2, 1])$	$[1, 2]$
$\text{sort (} xs ++ ys)$	$\text{sort } ([2, 1] ++ [])$	$[1, 2]$

How QuickSpec works

(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1, 3]$

$ys \rightarrow [3]$

xs

reverse (reverse xs)

sort xs

sort (reverse xs)

sort (xs++ys)

How QuickSpec works

(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1, 3]$

$ys \rightarrow [3]$

xs

$[2, 1, 3]$

$\text{reverse}(\text{reverse } xs)$

$\text{reverse}(\text{reverse } [2, 1, 3])$

$\text{sort } xs$

$\text{sort } [2, 1, 3]$

$\text{sort}(\text{reverse } xs)$

$\text{sort}(\text{reverse } [2, 1, 3])$

$\text{sort}(xs ++ ys)$

$\text{sort}([2, 1, 3] ++ [3])$

How QuickSpec works

(General idea at least)

- 1. Term generation (small \rightarrow large)
- 2. Testing and evaluation (create equivalence classes)
- 3. Extract equations. Prune redundant using rewriting.

$xs \rightarrow [2, 1, 3]$
 $ys \rightarrow [3]$

xs	$[2, 1, 3]$	$[2, 1, 3]$
$reverse\ (reverse\ xs)$	$reverse\ (reverse\ [2, 1, 3])$	$[2, 1, 3]$
$sort\ xs$	$sort\ [2, 1, 3]$	$[1, 2, 3]$
$sort\ (reverse\ xs)$	$sort\ (reverse\ [2, 1, 3])$	$[1, 2, 3]$
$sort\ (xs++ys)$	$sort\ ([2, 1, 3] ++ [3])$	$[1, 2, 3, 3]$

How QuickSpec works

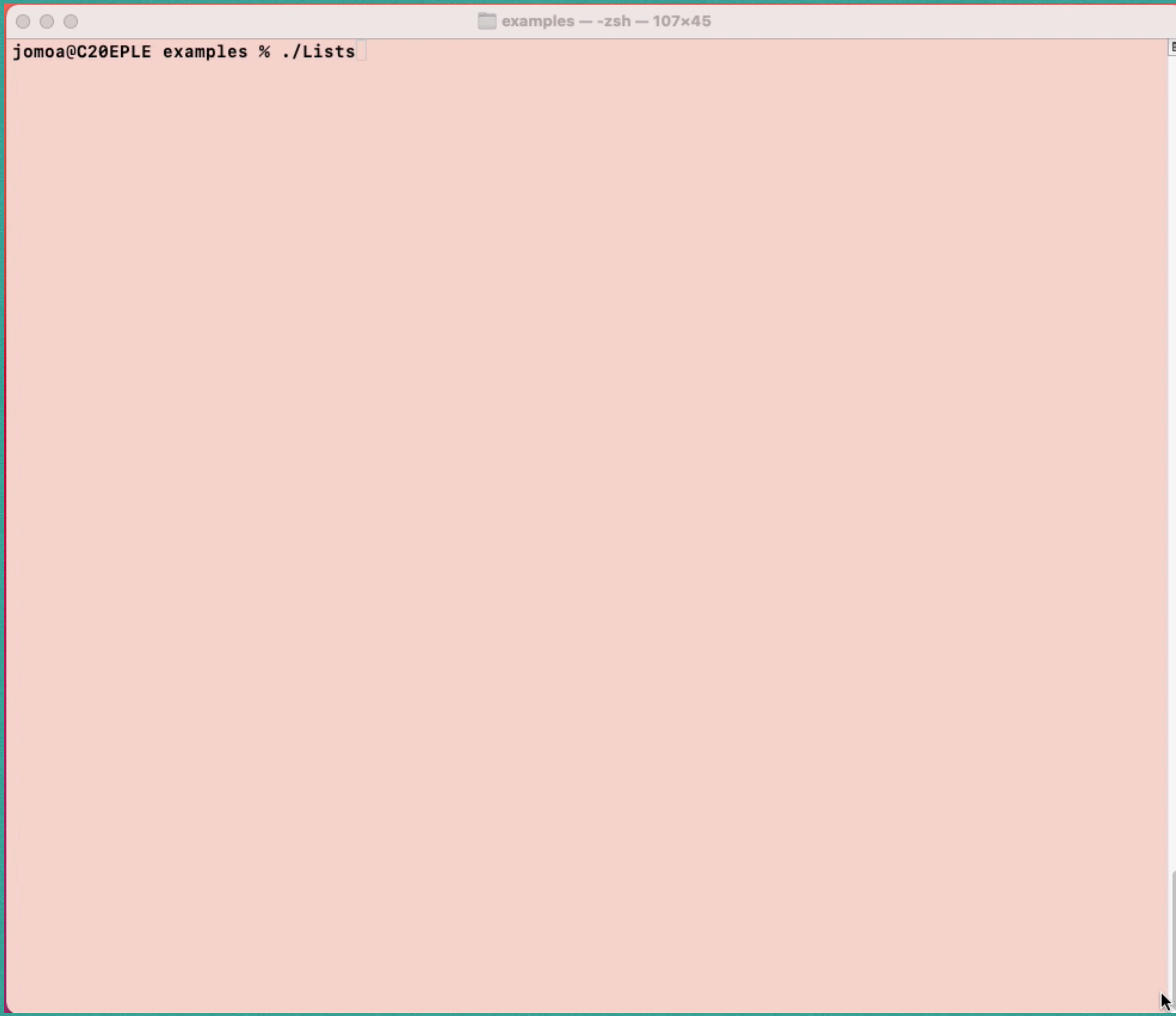
(General idea at least)

1. Term generation (small \rightarrow large)
2. Testing and evaluation (create equivalence classes)
3. Extract equations. Prune redundant using rewriting.

`reverse (reverse xs) = xs`
`sort (reverse xs) = sort xs`

~~`reverse (reverse []) = []`
`reverse (reverse [xs++ys]) = [xs++ys]`
`sort (reverse (sort xs)) = sort (sort xs)`~~

~~...~~



A terminal window with a light orange background. The title bar at the top shows three window control buttons (red, yellow, green) on the left, a folder icon and the text "examples — -zsh — 107x45" in the center, and a close button (red square) on the right. The terminal content shows the prompt "jomoa@C20EPLE" followed by "examples % ./Lists" with a cursor. A vertical scrollbar is on the right side.

```
jomoa@C20EPLE examples % ./Lists
```


Scalability?

A stress test

- 30+ functions, large chunk of Haskell's list library.
- Would hit exponential growth of search space...
- **But:**
 - Few equations contain near 30 symbols.
 - Interesting properties share similar structure.

```
main = quickSpec [  
  con "length" (length :: [A] -> Int),  
  con "sort" (sort :: [Int] -> [Int]),  
  con "scanr" (scanr :: (A -> B -> B) -> B -> [A] -> [B]),  
  con "succ" (succ :: Int -> Int),  
  con ">>=" ((>>=) :: [A] -> (A -> [B]) -> [B]),  
  con "snd" (snd :: (A, B) -> B),  
  con "reverse" (reverse :: [A] -> [A]),  
  con "0" (0 :: Int),  
  con ",", (,) :: A -> B -> (A, B)),  
  con ">=>" ((>=>) :: (A -> [B]) -> (B -> [C]) -> A -> [C]),  
  con ":" ((:) :: A -> [A] -> [A]),  
  con "break" (break :: (A -> Bool) -> [A] -> ([A], [A])),  
  con "filter" (filter :: (A -> Bool) -> [A] -> [A]),  
  con "scanl" (scanl :: (B -> A -> B) -> B -> [A] -> [B]),  
  con "zipWith" (zipWith :: (A -> B -> C) -> [A] -> [B] -> [C]),  
  con "concat" (concat :: [[A]] -> [A]),  
  con "zip" (zip :: [A] -> [B] -> [(A, B)]),  
  con "usort" (usort :: [Int] -> [Int]),  
  con "sum" (sum :: [Int] -> Int),  
  con "++" ((++) :: [A] -> [A] -> [A]),  
  con "map" (map :: (A -> B) -> [A] -> [B]),  
  con "foldl" (foldl :: (B -> A -> B) -> B -> [A] -> B),  
  con "takeWhile" (takeWhile :: (A -> Bool) -> [A] -> [A]),  
  con "foldr" (foldr :: (A -> B -> B) -> B -> [A] -> B),  
  con "drop" (drop :: Int -> [A] -> [A]),  
  con "dropWhile" (dropWhile :: (A -> Bool) -> [A] -> [A]),  
  con "span" (span :: (A -> Bool) -> [A] -> ([A], [A])),  
  con "unzip" (unzip :: [(A, B)] -> ([A], [B])),  
  con "+" ((+) :: Int -> Int -> Int),  
  con "[]" ([] :: [A]),  
  con "partition" (partition :: (A -> Bool) -> [A] -> ([A], [A])),  
  con "fst" (fst :: (A, B) -> A),  
  con "take" (take :: Int -> [A] -> [A])  
]
```


Current work

Scaling exploration

- Limitations: theories with 30+ functions, large terms.
- Use **templates** to skip directly to interesting parts of search space.
- Search only small terms + instances of templates.
- Next: Template mining, applications.

Template-based Theory Exploration: Discovering Properties of Functional Programs by Testing.

Sólrún Halla Einarsdóttir, Nicholas Smallbone and Moa Johansson, Proceedings of IFL, to appear 2021.



To conclude...

- Ongoing work — get in touch if you want to try it out!
- Hipster/QuickSpec are available for download.

Read more:

- ***Quick Specifications for the Busy Programmer.*** Nicholas Smallbone, Moa Johansson, Koen Claesson and Maximilian Algehed. Journal of Functional Programming, 2017.
- ***Automated Theory Exploration for Interactive Theorem Proving.*** Moa Johansson. Conference on Interactive Theorem Proving (ITP), p. 1-11, 2017.