

A Coq Formalisation of a Core of R

Martin BODIN

Center for Mathematical Modeling, Universidad de Chile

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- More than 10,000 packages;
- More than 2 million users worldwide;
- Used by 70% of data miners (24% as primary language).

R: A Programming Language About Vectors

```
1 v <- c(10, 12, 14, 11, 13)
2 v[1]                                # Returns 10
```

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3 indices <- c(3, 5, 1)
4 v[indices]                           # Returns c(14, 13, 10)
```

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1 v <- c(10, 12, 14, 11, 13)
2 v[1]                                # Returns 10
3 indices <- c(3, 5, 1)
4 v[indices]                          # Returns c(14, 13, 10)
5 v[-2]                               # Returns c(10, 14, 11, 13)
```

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4 v[indices] # Returns c(14, 13, 10)
5 v[-2] # Returns c(10, 14, 11, 13)
6 v[-indices] # Returns c(12, 11)
```

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6 v[-indices] # Returns c(12, 11)
7 v[c(FALSE, TRUE, FALSE)] # Returns c(12, 13)
```

R: A Programming Language About Vectors

```
1 v <- c(10, 12, 14, 11, 13)
2 v[1] # Returns 10
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4 v[indices] # Returns c(14, 13, 10)
5 v[-2] # Returns c(10, 14, 11, 13)
6 v[-indices] # Returns c(12, 11)
7 v[c(FALSE, TRUE, FALSE)] # Returns c(12, 13)
8 f <- function (i, offset)
9     v[i + offset] # ??
```


R: A Lazy Programming Language

```
1 f <- function (x, y = x) {  
2   x <- 1  
3   y  
4   x <- 2  
5   y  
6 }  
7 f (3)
```

R: A Lazy Programming Language

```
1 f <- function (x, y = x) {  
2   x <- 1  
3   y  
4   x <- 2  
5   y  
6 }  
7 f (3) # Returns 1
```

R: A Lazy Programming Language

```
1 f <- function (x, y = x) {  
2   x <- 1  
3   y  
4   x <- 2  
5   y  
6 }  
7 f (3) # Returns 1
```

```
1 f <- function (x, y) if (x == 1) y  
2 f (1, a <- 1)  
3 a # Returns 1  
4 f (0, b <- 1)  
5 b # Raises an error
```

R: A Dynamic Programming Language

```
1 f <- function (x, y) missing (y)
2 f (1, 2) # Returns FALSE
3 f (1) # Returns TRUE
4 f () # Returns TRUE
```

R: A Dynamic Programming Language

```
1 f <- function (x, y) missing (y)
2 f (1, 2) # Returns FALSE
3 f (1) # Returns TRUE
4 f () # Returns TRUE
```

```
1 f <- function (expr) {
2   x <- 2
3   y <- 3
4   eval (substitute (expr)) # Evaluates the body "expr"
5                             # in the local environment
6 }
7 f (x + y) # Returns 5
8 x + y # Raises an error
```

R: A Dynamic Programming Language

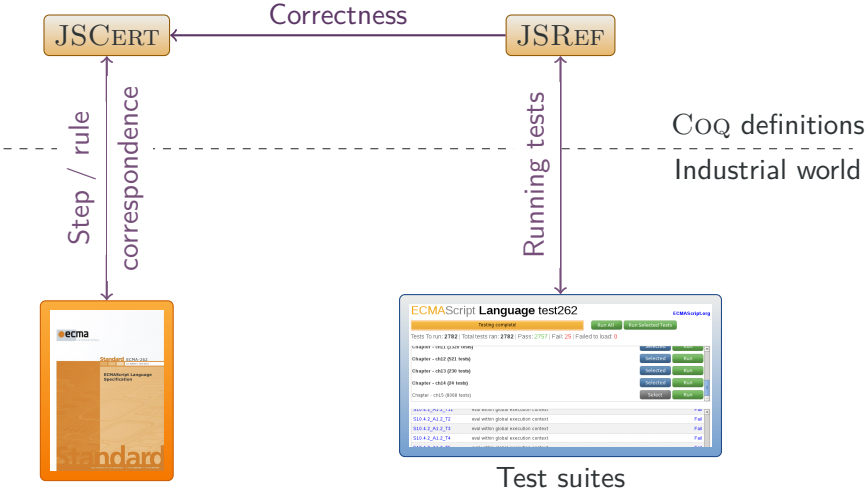
```
1 f <- function (x, y) missing (y)
2 f (1, 2) # Returns FALSE
3 f (1) # Returns TRUE
4 f () # Returns TRUE
```

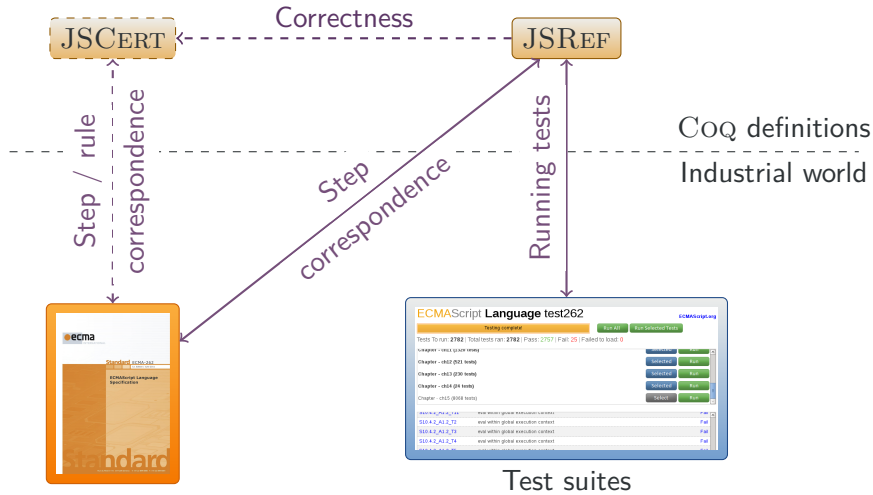
```
1 f <- function (expr) {
2   x <- 2
3   y <- 3
4   eval (substitute (expr)) # Evaluates the body "expr"
5                               # in the local environment
6 }
7 f (x + y) # Returns 5
8 x + y # Raises an error
```

```
1 "(" <- function (x) 2 * x
2 ((9)) # Returns 36
```

Formalising R

- Specification ✘
- Reference interpreter ✔
 - GNU R.
- Test suites ✔
 - TestR, Genthat, etc.





A Stratified Approach

Rule-based semantics

As usable as possible

Coq monadic interpreter

Close to the C

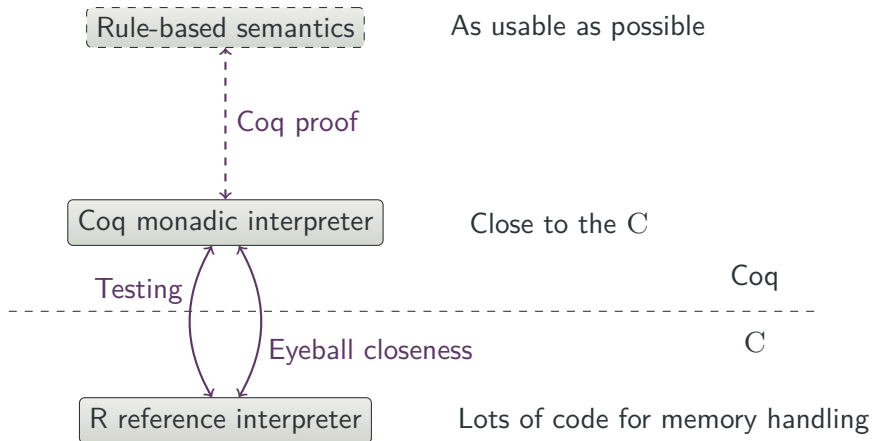
Coq

C

R reference interpreter

Lots of code for memory handling

A Stratified Approach



Eyeball Closeness

- C is imperative, pointer-based;
- Coq is purely functional, value-based;
- The translation is based on a monad state + error.

Eyeball Closeness: Enumeration

C code

```
1  typedef enum {  
2      NILSXP = 0,  
3      SYMSXP = 1,  
4      LISTSXP = 2,  
5      CLOSXP = 3,  
6      ENVSXP = 4,  
7      PROMSXP = 5,  
8      /* ... */  
9  } SEXPTYPE;
```

Coq code

```
1  Inductive SExpType :=  
2      | NilSxp  
3      | SymSxp  
4      | ListSxp  
5      | CloSxp  
6      | EnvSxp  
7      | PromSxp  
8      (* ... *)  
9      .
```

Eyeball Closeness: Records

C code

```
1  struct sxpinfo_struct {
2    SEXPTYPE type      : 5;
3    unsigned int obj   : 1;
4    unsigned int named : 2;
5    unsigned int gp    : 16;
6    unsigned int mark  : 1;
7    unsigned int debug : 1;
8    unsigned int trace : 1;
9    unsigned int spare : 1;
10   unsigned int gcgen : 1;
11   unsigned int gccls : 3;
12 };
13 /* Total: 32 bits */
```

Coq code

```
1  Inductive named_field :=
2    | named_temporary
3    | named_unique
4    | named_plural
5    .
6
7  Record SxpInfo :=
8    make_SxpInfo {
9      type : SExpType ;
10     obj : bool ;
11     named : named_field ;
12     gp : nbits 16
13   }.
```

```
1 union {  
2   struct primxsp_struct primxsp;  
3   struct symxsp_struct symxsp;  
4   struct listxsp_struct listxsp;  
5   /* ... */  
6 };
```

C code

- Accesses are unsafe.

```
1 Inductive SExpRec_union :=  
2   | primSxp : PrimSxp_struct -> SExpRec_union  
3   | symSxp  : SymSxp_struct  -> SExpRec_union  
4   | listSxp : ListSxp_struct -> SExpRec_union  
5   (* ... *)  
6   .
```

Coq code

- Accesses must be guarded.

Eyeball Closeness: Reading Pointers

C code

```
1  symsexp_struct p_sym = p->symsexp;  
2  /* ... */
```

Coq code

```
1  read%sym p_sym := p using S in  
2  (* ... *)
```

```
1  Inductive result (T : Type) :=  
2  | result_success : state -> T -> result T  
3  | result_error : result T.
```

```
1  Notation "'read%sym' p_sym ':= ' p 'using' S 'in' cont" :=  
2  (match read S p with  
3  | Some p_ =>  
4    match p_ with  
5    | symSxp p_sym => cont  
6    | _ => result_error  
7    end  
8  | None => result_error  
9  end).
```

EyeBall Closeness: C Code

```
1  EXP* applyClosure (EXP* op, EXP* arglist, EXP* rho){
2
3      EXP* formals, actuals, savedrho, newrho, res;
4
5      if (rho->type != ENVSWP)
6          error ("'rho' must be an environment.");
7
8      formals = op->clo.formals;
9      savedrho = op->clo.env;
10
11     PROTECT (actuals = matchArgs (formals, arglist));
12
13     /* ... */
14
15     return res;
16 }
```

Eyeball Closeness: Coq Code

```
1 Definition applyClosure (S : state) (op arglist rho : EXP_pointer)
2   : result EXP_pointer :=
3
4   read%defined rho_ := rho using S in
5   ifb type rho_ <> EnvSxp then
6     result_error S "'rho' must be an environment."
7   else
8     read%clo op_clo := op using S in
9     let formals := clo_formals op_clo in
10    let savedrho := clo_env op_clo in
11
12    let%success actuals := matchArgs S formals arglist using S in
13
14    (* ... *)
15
16    result_success S res.
```

R Features

```
1 FUNTAB R_FunTab[] = {
2     {"if",          do_if,          2},
3     {"while",      do_while,       2},
4     {"break",      do_break,       0},
5     {"return",     do_return,      1},
6     {"function",   do_function,   -1},
7     {"<-",        do_set,         2},
8     {"(",          do_paren,       1},
9     /* ... */
10    {"+",          do_arith1,      2},
11    {"-",          do_arith2,      2},
12    {"*",          do_arith3,      2},
13    {"/",          do_arith4,      2},
14    /* ... */
15    {"cos",        do_math20,      1},
16    {"sin",        do_math21,      1},
17    {"tan",        do_math22,      1},
18    /* ... */ }
```

```
1 FUNTAB R_FunTab[] = {  
2   {"if",          do_if,          2},
```

The core is what is needed to call these functions.

- The core is small;
- The formalisation is easily extendable.

Content of the core

- Expression evaluation;
- Function calls;
- Environments, delayed evaluation (promises);
- Initialisation of the global state.

```
17   {"tan",          do_math22,      1},  
18   /* ... */ }
```

The current formalisation is modular

- It is easy to add features.
- We can implement specific features and certify their implementations.

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Providing trust

- Test the formalisation...
- ...or certify it (CompCert's semantics, Formalin, etc.).

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Building proofs

- Building a rule-based formalisation;
- A more functional interpreter.

} What is the best to build large proofs of programs?

Proof that $1 + 1$ reduces to 2 in JSCERT

```
1  Lemma one_plus_one_exec : forall S C,  
2    red_expr S C one_plus_one (out_ter S (prim_number two)).  
3  Proof.  
4    intros. unfold one_plus_one.  
5    eapply red_expr_binary_op.  
6    constructor.  
7    eapply red_spec_expr_get_value.  
8    eapply red_expr_literal. reflexivity.  
9    eapply red_spec_expr_get_value_1.  
10   eapply red_spec_ref_get_value_value.  
11   eapply red_expr_binary_op_1.  
12   eapply red_spec_expr_get_value.  
13   eapply red_expr_literal. reflexivity.  
14   eapply red_spec_expr_get_value_1.  
15   eapply red_spec_ref_get_value_value.  
16   eapply red_expr_binary_op_2.  
17   eapply red_expr_binary_op_add.  
18   eapply red_spec_convert_twice.  
19   eapply red_spec_to_primitive_pref_prim.  
20   eapply red_spec_convert_twice_1.  
21   eapply red_spec_to_primitive_pref_prim.  
22   eapply red_spec_convert_twice_2.  
23   eapply red_expr_binary_op_add_1_number.  
24   simpl. intros [A|A]; inversion A.  
25   eapply red_spec_convert_twice.  
26   eapply red_spec_to_number_prim. reflexivity.  
27   eapply red_spec_convert_twice_1.  
28   eapply red_spec_to_number_prim. reflexivity.  
29   eapply red_spec_convert_twice_2.  
30   eapply red_expr_puremath_op_1. reflexivity.  
31  Qed.
```

Imperative interpreter

```
let%success res = f args in  
read%clo res_clo = res in
```

Functionnal interpreter

```
let%success res = f S args using S in  
read%clo res_clo = res using S in
```

ECMA-style specification

- 1 Let `res` be the result of calling `f` with argument `args`;
- 2 At this stage, `res` should be a closure.

Rule-based semantics

```
| run_1 : forall S args o1 o2,  
  run S (f args) o1 -> run S (term_1 o1) o2 -> run S (term o1) o2  
| run_2 : forall S res_clo o,  
  is_closure S res res_clo -> run S (term_2 res_clo) o -> run S (term_1 (out S res)) o
```

Thank you for listening!

The current formalisation is modular

- It is easy to add features.
- We can implement specific features and certify their implementations.

Providing trust

- Test the formalisation...
- ...or certify it (CompCert's semantics, Formalin, etc.).

Building proofs

- Building a rule-based formalisation;
 - A more functional interpreter.
- } What is the best to build large proofs of programs?

1 R

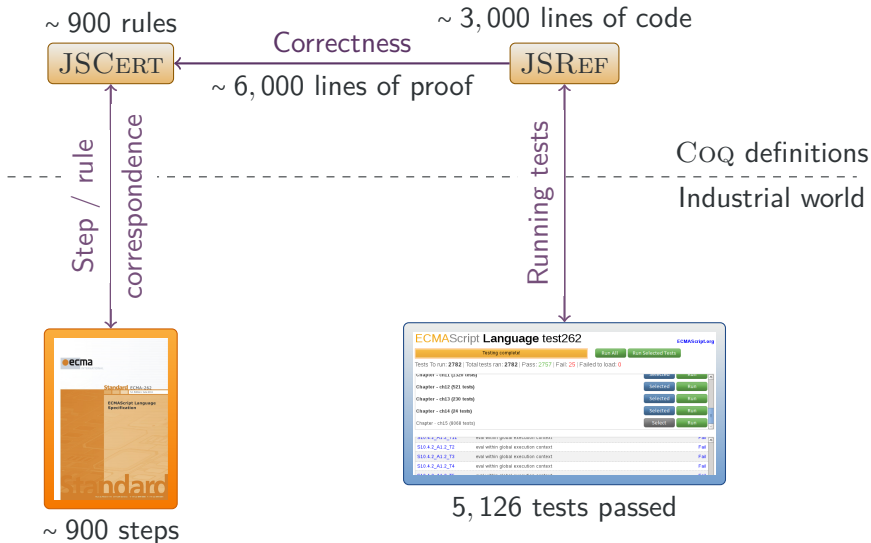
2 R Trust Sources

3 Eyeball Closeness

4 R Features

Bonuses

- ① JSCERT;
- ② Representing imperativity in a functional setting;
- ③ Semantics in COQ;
- ④ Semantic sizes;
- ⑤ Other Subtleties of R;
- ⑥ Reading pointers;
- ⑦ Parsing R;
- ⑧ The full state+error monad;
- ⑨ Inputs and outputs.



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How to Represent Imperative Features in a Functional Setting

- Structures like maps are easy to implement;
- We can represent every element of the state of a program (memory, outputs, etc.) in a data-structure;
- We have to pass this structure along the program.

Enter the monad

```
1 if_success (run s1 p) (fun s2 =>
2   let s3 = write s2 x v in
3   if_success (run s3 p') (fun s4 =>
4     return_success s4))
```

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```
1 Inductive semantics : state -> prog -> state -> Prop ->
2
3   | semantics_skip : forall s p, semantics s p s
4
5   | semantics_seq : forall s1 s2 s3 p1 p2,
6     semantics s1 p1 s2 ->
7     semantics s2 p2 s3 ->
8     semantics s1 (seq p1 p2) s3
9
10  | semantics_asgn : forall s x v,
11    semantics s (asgn x v) (write s x v)
12  .
```

“ $s_1 ; s_2$ ” is evaluated as follows.

- 1 Let o_1 be the result of evaluating s_1 .
- 2 If o_1 is an exception, return o_1 .
- 3 Let o_2 be the result of evaluating s_2 .
- 4 If an exception V was thrown, return ($Throw, V, empty$).
- 5 If $o_2.value$ is empty, let $V = o_1.value$, otherwise let $V = o_2.value$.
- 6 Return ($o_2.type, V, o_2.target$).

“ $s_1 ; s_2$ ” is evaluated as follows.

- 1 Let o_1 be the result of evaluating s_1 .
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- 3 Let o_2 be the result of evaluating s_2 .

“s1 ; s2” is evaluated as follows.

- ❶ Let o_1 be the result of evaluating s1.
- ❷ If o_1 is an exception, return o_1 .
- ❸ Let o_2 be the result of evaluating s2.

SEQ-1(s_1, s_2)

$$\frac{S, C, s_1 \Downarrow o_1 \quad o_1, seq_1 \quad s_2 \Downarrow o}{S, C, seq \quad s_1 \quad s_2 \Downarrow o}$$

SEQ-2(s_2)

$$\frac{}{o_1, seq_1 \quad s_2 \Downarrow o_1}$$

abort o_1

SEQ-3(s_2)

$$\frac{o_1, s_2 \Downarrow o_2 \quad o_1, o_2, seq_2 \Downarrow o}{o_1, seq_1 \quad s_2 \Downarrow o}$$

¬abort o_1

...

Sequence in JSCERT

1 **Inductive** red_stat : state → scope → stat → out → Prop :=

2
3 | red_stat_seq_1 : forall S C s1 s2 o1 o,
4 red_stat S C s1 o1 →
5 red_stat S C (seq_1 s2 o1) o →
6 red_stat S C (seq s1 s2) o

$$\frac{\text{SEQ-1}(s_1, s_2) \quad S, C, s_1 \Downarrow o_1 \quad o_1, \text{seq}_1 s_2 \Downarrow o}{S, C, \text{seq } s_1 s_2 \Downarrow o}$$

7
8 | red_stat_seq_2 : forall S C s2 o1,
9 abort o1 →
10 red_stat S C (seq_1 s2 o1) o1

$$\frac{\text{SEQ-2}(s_2)}{o_1, \text{seq}_1 s_2 \Downarrow o_1} \quad \text{abort } o_1$$

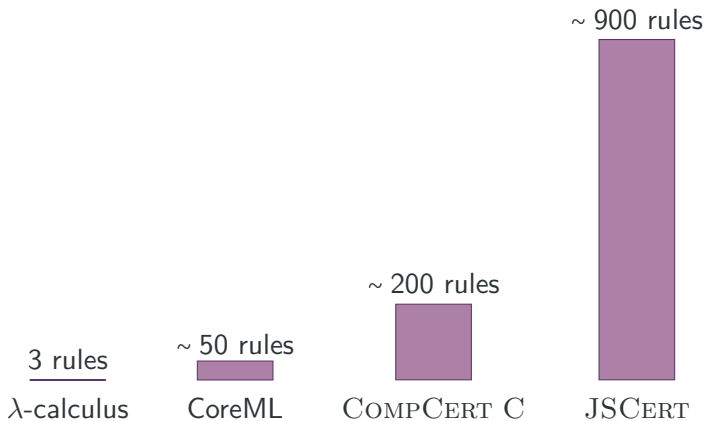
11
12 | red_stat_seq_3 : forall S0 S C s2 o2 o,
13 red_stat S C s2 o2 →
14 red_stat S C (seq_2 o2) o →
15 red_stat S0 C (seq_1 s2 (out_ter S)) o

$$\frac{\text{SEQ-3}(s_2) \quad o_1, s_2 \Downarrow o_2 \quad o_1, o_2, \text{seq}_2 \Downarrow o}{o_1, \text{seq}_1 s_2 \Downarrow o} \quad \neg \text{abort } o_1$$

16
17 (* ... *)

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Semantic Sizes



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Other Subtleties

```
1 f <- function (x, y, option, longArgumentName) ...  
2  
3 # All the following calls are equivalent.  
4 f (1, 2, "something", 42)  
5 f (option = "something", 1, 2, 42)  
6 f (opt = "something", long = 42, 1, 2)
```

Other Subtleties

```
1 f <- function (x, y, option, longArgumentName) ...  
2  
3 # All the following calls are equivalent.  
4 f (1, 2, "something", 42)  
5 f (option = "something", 1, 2, 42)  
6 f (opt = "something", long = 42, 1, 2)
```

```
1 f <- function (abc, ab, de) c (abc, ab, de)  
2  
3 # All the following calls are equivalent.  
4 f (1, 2, 3)  
5 f (de = 3, 1, 2)  
6 f (d = 3, 1, 2)  
7 f (ab = 2, 1, 2)  
8 f (ab = 2, a = 1, 3)  
9  
10 f (a = 3, 1, 2) # Returns an error.
```

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Eyeball Closeness: Reading Pointers

C code

```
1  sympxp_struct p_sym = p->sympxp;  
2  /* ... */
```

- May fail because the pointer `p` is unbound;
- May fail because the union `*p` is not a `sympxp`.

Eyeball Closeness: Reading Pointers

C code

```
1 symsxp_struct p_sym = p->symsxp;  
2 /* ... */
```

Coq code, first try

```
1 match read p with  
2   (* ... *)  
3 end
```

- May fail because the pointer `p` is unbound;
- May fail because the union `*p` is not a `symsxp`.

Eyeball Closeness: Reading Pointers

C code

```
1  symsexp_struct p_sym = p->symsexp;  
2  /* ... */
```

- May fail because the pointer `p` is unbound;
- May fail because the union `*p` is not a `symsexp`.

Coq code, second try

```
1  match read S p with  
2  | Some p_ =>  
3    match p_ with  
4    | symSxp p_sym =>  
5      (* ... *)  
6    | _ => (* ??? *)  
7    end  
8  | None => (* ??? *)  
9  end
```

Eyeball Closeness: Reading Pointers

C code

```
1  symsexp_struct p_sym = p->symsexp;  
2  /* ... */
```

- May fail because the pointer `p` is unbound;
- May fail because the union `*p` is not a `symsexp`.

Coq code, third try

```
1  match read S p with  
2  | Some p_ =>  
3    match p_ with  
4    | symSxp p_sym =>  
5      (* ... *)  
6    | _ => error  
7  end  
8  | None => error  
9  end
```

```
1  Inductive result (T : Type) :=  
2    | success : state -> T -> result T  
3    | error : result T  
4    .
```

Eyeball Closeness: Reading Pointers

C code

```
1  symsxp_struct p_sym = p->symsxp;  
2  /* ... */
```

- May fail because the pointer `p` is unbound;
- May fail because the union `*p` is not a `symsxp`.

Coq code, fourth try

```
1  read%sym p_sym := p using S in  
2  (* ... *)
```

```
1  Inductive result (T : Type) :=  
2  | success : state -> T -> result T  
3  | error : result T  
4  .
```

```
1  Notation "'read%sym' p_sym ':= ' p  
2  'using' S 'in' cont" :=  
3  (* ... *).
```

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```

1  expr:
2  | NUM_CONST          { $$ = $1; setId( $$, @$); }
3  | STR_CONST         { $$ = $1; setId( $$, @$); }
4  | NULL_CONST        { $$ = $1; setId( $$, @$); }
5  | SYMBOL            { $$ = $1; setId( $$, @$); }
6  | LBRACE exprlist RBRACE
7  { $$ = xxexprlist($1,&@1,$2); setId( $$, @$); }
8  | LPAR  expr_or_assign  RPAR
9  { $$ = xxparen($1,$2);  setId( $$, @$); }

```

```

1  expr:
2  | c = NUM_CONST      { c }
3  | c = STR_CONST     { c }
4  | c = NULL_CONST    { c }
5  | c = SYMBOL        { c }
6  | b = LBRACE; e = exprlist; RBRACE
7  { eatLines := false; lift2 (only_state xxexprlist) b e }
8  | p = LPAR; e = expr_or_assign; RPAR
9  { lift2 (no_runs xxparen) p e }

```

- ① JSCERT;
- ② Representing imperativity in a functional setting;
- ③ Semantics in COQ;
- ④ Semantic sizes;
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- ⑥ Reading pointers;
- ⑦ Parsing R;
- ⑧ The full state+error monad;
- ⑨ Inputs and outputs.

The Full State+Error Monad

```
1 Inductive result (A : Type) :=
2   | result_success : state -> A -> result A
3   | result_error : state -> string -> result A
4   | result_longjump : state -> nat -> context_type -> result A
5   | result_impossible : state -> string -> result A
6   | result_not_implemented : string -> result A
7   | result_bottom : state -> result A
8   .
```

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```
1 Record input := make_input {  
2   prompt_string : stream string ;  
3   random_boolean : stream bool  
4   }.
```

```
1 Record output := make_output {  
2   output_string : list string  
3   }.
```

```
1 Record state := make_state {  
2   inputs :> input ;  
3   outputs :> output ;  
4   state_memory :> memory ;  
5   state_context : context  
6   }.
```

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1 R

2 R Trust Sources

3 Eyeball Closeness

4 R Features