

Characteristic Formulae for Mechanized Program Verification

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Correctness as a theorem

- Using a **proof assistant**, one can state (virtually) any theorem and (possibly with some effort) build a proof of this theorem that the proof assistant can check.
- A statement of the form "**this programs satisfies this specification**" can be viewed as the statement of a theorem.
- So, in theory, proof assistants can be used to build **machine-checked proofs** of program correctness.

The question is: how?

Logical representation of programs

From a logical point of view, what is a program?

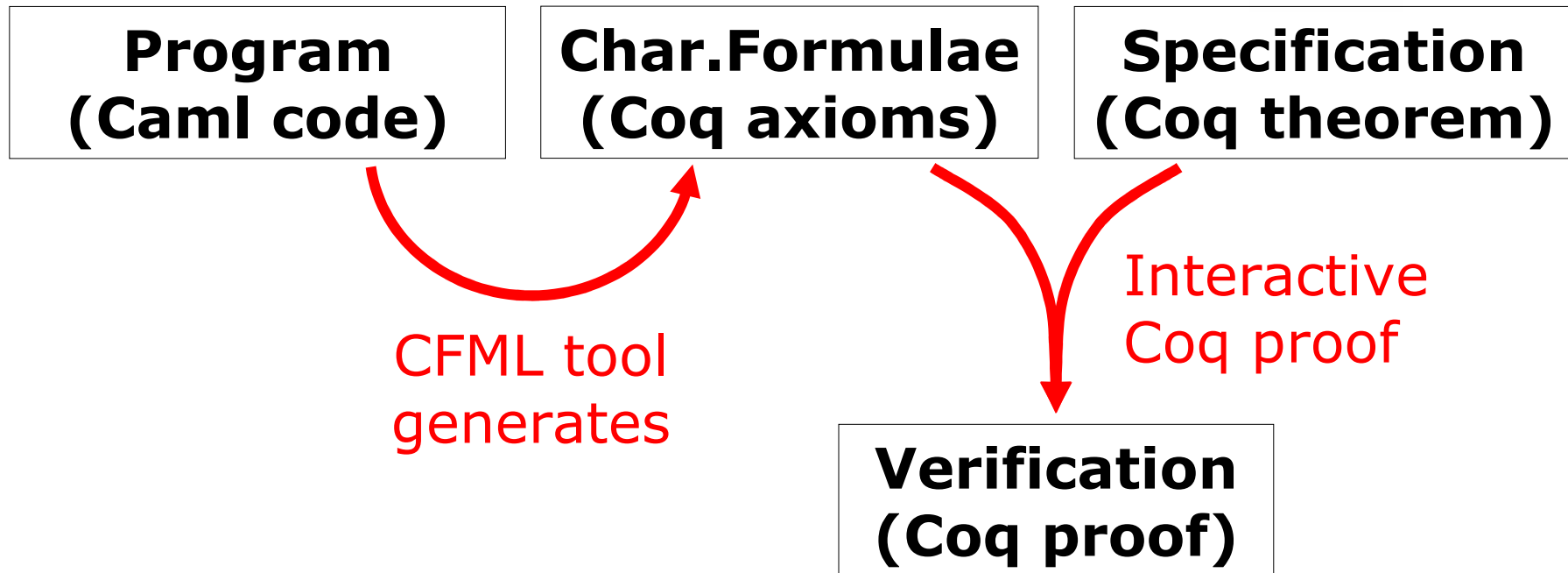
- **syntactic view**: a program is just a piece of syntax
- **semantic view**: a binary relation between states
- **Hoare logic view**: a relation between state predicates (possibly presented as a predicate transformer)

The three views can be formalized in the logic; but we don't want to manipulate syntax explicitly; moreover we prefer manipulating predicates directly, as they allow for abstraction.

Remaining question: can we find an algorithm that produces, given an arbitrary program, the corresponding predicate transformer?

Characteristic formulae

I have developed an approach to program verification based on the generation of characteristic formulae (CF)



Closely related work

Origins of Characteristic Formulae:

- Hennessy-Milner logic (1980): two processes are bisimilar iff their characteristic formulae are equivalent
- Honda, Berger & Yoshida (2004,2006): one can build a most-general specification (i.e. Hoare triple) of any PCF program, without referring to a representation of syntax.
 - strong logic: completeness with higher-order fcts
 - yet ad-hoc logic, making it hard to reuse proof tools

Characteristic formulae in this work

1) CF expressed in a standard higher-order logic

→ accomodates a standard proof assistant

2) CF with Separation Logic style specification

→ supports modular verification

3) CF of linear size and easy to read

→ allows the approach to scale up

4) Implementation of a CF generator

→ supports verification of real Caml code

Proof assistants

User writes:

- definitions
- statement of theorems
- key steps of reasoning

Proof assistant checks:

- well-formedness of definitions and statements
- legitimacy of each step of reasoning

No mistake possible:

If all the steps involved in the proof of theorem are accepted, then the theorem is true

Coq at a glance

The screenshot shows the CoqIDE interface with three main components highlighted by yellow boxes:

- Theorem statement:** A box highlighting the top part of the code, showing the theorem name `consistent_set` and its arguments `E S`.
- Sequence of tactics:** A box highlighting the middle part of the code, showing various tactic applications like `forall`, `partial_fixed_point`, `exists`, `intros`, `exists-`, `unfold`, `destruct_if`, `spec_epsilon`, `apply-`, `intros`, `split`, `simpl.`, `let`, and `Qed.`
- Current position:** A box highlighting the bottom part of the code, showing the current goal `partial_fixed_point` and the current tactic `spec_epsilon`.

On the right side, there are two panels:

- Hypotheses:** A panel listing the current hypotheses, including `A : Type`, `B : Type`, `I : Inhabited B`, `E : binary B`, `F : (A -> B) -> A -> B`, `S : A --> B -> Prop`, `Equiv : equiv E`, `Cons : consistent_set E S`, `Fixi : forall fi : A --> B, S fi -> partial_fixed_point E F fi`, `covers := fun (x : A) (fi : A --> B) => S fi /\ dom fi x : A -> A --> B -> Prop`, `D := fun x : A => exists fi, covers x fi : A -> Prop`, `f := fun x : A => If D x then epsilon (covers x) x else arbitrary : A -> B`, `f' : A --> B`, `Upper' : upper_bound (extends E) S f'`, `x : A`, and `Dx : D x`.
- Proof obligations:** A panel showing the current goal `E (f x) (f' x)` and the tactic `partial_fixed_po`.

At the bottom of the window, the status bar shows "Ready, proving lub_of_consistent_set" and "Line: 299 Char: 1 CoqIde started".

Specification

Heap h : finite map from locations to values

$h : \text{heap}$ $\text{heap} := \text{fmap loc dyn}$
 $\text{dyn} := \{A:\text{Type}; v:A\}$

Heap predicate H : description of a heap state

$H : \text{hprop}$ $\text{hprop} := \text{heap} \rightarrow \text{Prop}$

Hoare triple: $\{H\} t \{Q\}$ asserts that, in an initial heap satisfying the predicate H , the evaluation of the term t terminates and produces a value v such that the final heap satisfies the predicate $(Q v)$.

H is the *pre-condition* and Q is the *post-condition*

Characteristic formulae

The characteristic formula of a term t , written $\llbracket t \rrbracket$, is a higher-order predicate such that:

$$\forall H. \forall Q. \quad \llbracket t \rrbracket H Q \iff \{H\} t \{Q\}$$

→ obtain a predicate capturing the behavior of a program but not referring to the syntax of its code

→ **translates source code into logical predicates**

Note that $\llbracket t \rrbracket$ has type "hprop → (A → hprop) → Prop"

Soundness and completeness

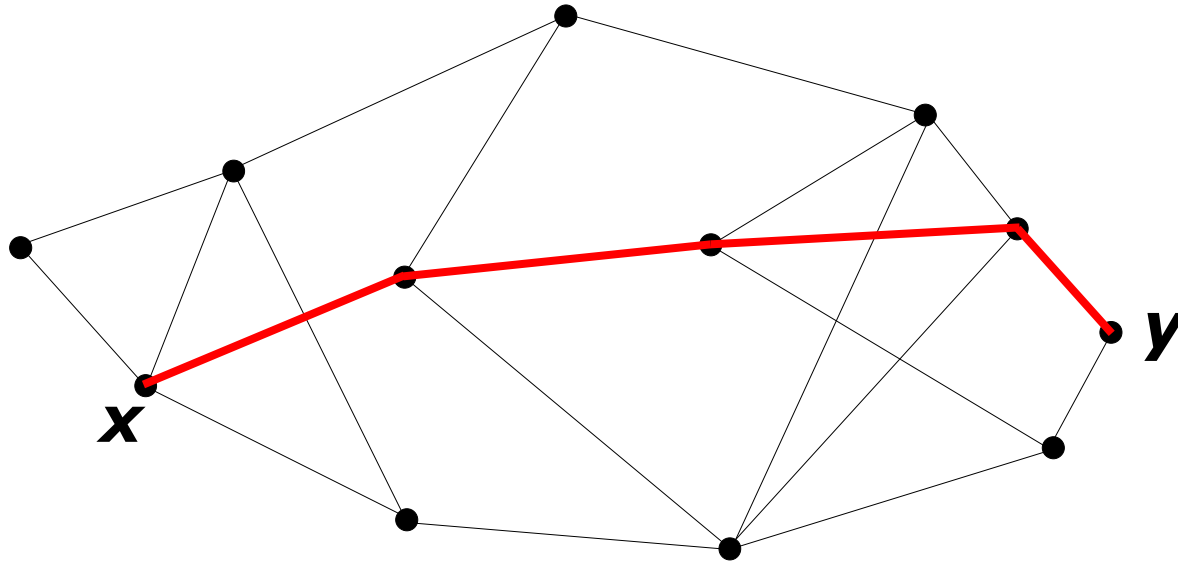
Soundness: if the CF of a program holds of a specification, then the program satisfies this spec.

$$\left\{ \begin{array}{l} \llbracket t \rrbracket H Q \\ H h \end{array} \right. \Rightarrow \exists v. \exists h'. \left\{ \begin{array}{l} t/h \Downarrow v/h' \\ Q v h' \end{array} \right.$$

Completeness: if a program satisfies a specification, then the CF of that program holds of that specification

$$t/\emptyset \Downarrow n/h \Rightarrow \llbracket t \rrbracket [] (\lambda x. [x = n])$$

Dijkstra's shortest path algorithm



v : bool array

marking of treated nodes

b : intbar array

storing best known distances

q : (int*int) pqueue

ordering the nodes to treat

where intbar = Finite of int | Infinite

Implementation

```
val dijkstra : ((int*int)list)array -> int -> int -> intbar
let dijkstra g s e =
  let n = Array.length g in
  let b = Array.make n Infinite in
  let v = Array.make n false in
  let q = Pqueue.create() in
  b.(s) <- Finite 0;
  Pqueue.push (s,0) q;
  while not (Pqueue.is_empty q) do
    let (x,dx) = Pqueue.pop q in
    if not v.(x) then begin
      v.(x) <- true;
      let update (y,w) =
        let dy = dx + w in
        if (match b.(y) with
            | Finite d -> dy < d
            | Infinite -> true)
        then (b.(y) <- Finite dy; Pqueue.push (y,dy) q) in
      List.iter update g.(x);
    end;
  done;
  b.(e)
```

mutable structures

loop

pattern matching

higher-order function

abstract data structure

Material generated by CFML

Module Dijkstra (Pqueue : PqueueSig).

Axiom dijkstra : func.

func = datatype used to represent functions

Axiom dijkstra_cf :

```
(@CFPrint.tag tag_top_fun __ (@CFPrint.tag tag_body __ (forall K :
(CFHeaps.loc -> (int -> (int -> ((CFHeaps.hprop -> ((_ -> CFHeaps.hprop) ->
Prop)) -> Prop))))), (forall s : CFHeaps.loc, (forall s :
int, (forall e : int, (forall e : int, (forall e : int, (forall e : int,
'n) _ (local (fun H : CFHeaps.hprop -> (int -> CFHeaps.hprop) =>
(Logic.ex (fun Q1 : (int -> CFHeaps.hprop) -> ((Logic.and (((@CFPrint.tag
tag_apply __ (((@app_1 CFHeaps.loc) int) ml_array_length)...

```

characteristic formula

(goes on for about 100 more lines *)**

End Dijkstra.

→ The axioms are justified by the soundness theorem

Shortest path specification

Theorem `dijkstra_spec` : \forall `g x y G`,

`nonnegative_edges G ->`

`x \in nodes G ->`

`y \in nodes G ->`

`(App dijkstra g x y)`

`(g ~> GraphAdjList G)`

`(fun d => [d = dist G x y]`

`* g ~> GraphAdjList G)`

mathematical graph

pre-condition

post-condition

→ Understanding the specification does not require particular skills with proof assistants

Main invariant

```
Definition hinv Q B V : hprop :=
  g ~> GraphAdjList G    (* G : graph int *)
  \* v ~> Array V        (* V : array bool *)
  \* b ~> Array B        (* B : array intbar *)
  \* q ~> Pqueue Q       (* Q : multiset(int*int) *)
  \* [inv Q B V].
```

```
Record inv Q B V : Prop := {
  Bdist:  $\forall x, x \in \text{nodes } G \rightarrow V(x) = \text{true} \rightarrow$ 
         B(x) = dist G s x;
  Bbest:  $\forall x, x \in \text{nodes } G \rightarrow V(x) = \text{false} \rightarrow$ 
         B(x) = mininf weight (crossing V x);
  Qcorr:  $\forall x, (x,d) \in Q \rightarrow$ 
         x  $\in$  nodes G /\  $\exists p$ , crossing V x p /\ weight p = d;
  Qcomp:  $\forall x p, x \in \text{nodes } G \rightarrow \text{crossing } V \ x \ p \rightarrow$ 
          $\exists d, (x,d) \in Q \ /\ d \leq \text{weight } p$ ;
  SizeV: length V = n;
  sizeB: length B = n }
```


Main lemma about invariant

```
Lemma inv_update : forall L V B Q x y
  x \in nodes G ->
  has_edge G x y w ->
  dy = dx + w ->
  Finite dx = dist G s x ->
  inv (V\(x:=true)) B Q (new_crossing
  If len_gt (B\(y)) dy
    then inv (V\(x:=true)) (B\(y:=Finite dy)) (\{(y, dy)\} \u Q) ...
    else inv (V\(x:=true)) B Q (new_crossing x ((y,w)::L) V) .
```

no reference to CF

**maths-style reasoning
in terms of multisets**



Proof.

```
intros Nx Ed Dy Eq [Inv SV SB]. sets
lets NegP: nonneg_edges_to_path Neg.
intros z. lets [Bd Bb Hc Hk]: Inv z.
(* case z = y *)
forwards~ (px&Px&Wx&Mx): (@mininf_fin
lets Ny: (has_edge_in_nodes_r Ed).
sets p: ((x,y,w)::px).
asserts W: (weight p = dy). subst p.
tests (V'\(y)) as C; case_If as Nlt.
(* subcase y visisted, distance impro
false. rewrite~ Bd in Nlt. forwards M
rewrite weight_cons in M. math.
(* subcase y visisted, distance not improved *)
...
```

**All the nontrivial
reasoning is there**

**180 lines of proofs in
total for the invariant
(a third in this lemma)**

8 seconds to check

Verification of the code

```
Theorem dijkstra_spec :  $\forall$  g x y G, ... (App dijkstra  
Proof.
```

x-tactics

```
xcf. introv Pos Ns De. unfold GraphAdjList at 1. hdata_simpl.  
xextract as N Neg Adj. xapp. intros Ln. rewrite <- Ln in Neg.  
xapps. xapps. xapps. xapps*. xapps.
```

invariants

```
set (data := fun B V Q => g ~> Array N \*  
  v ~> Array V \* b ~> Array B \* q ~> Heap Q).  
set (hinv := fun VQ => let '(V,Q) := VQ in  
  Hexists B, data B V Q \* [inv G n s V B Q (crossing  
xseq (# Hexists V, hinv (V,\{\})))).
```

termination

```
set (W := lexico2 (binary_map (count (= true)) (upto n))  
  (binary_map card (downto 0))).
```

**lemma
application**

```
xwhile_inv W hinv.  
(* -- initial state satisfies the invariant -- *)  
refine (ex_intro' ( , ), unfold hinv,data. hsimp.  
  applys_eq~ inv_start 2. permut_simpl.
```

```
(* -- verification of the loop -- *)
```

```
intros [V Q]. unfold
```

```
(* ---- loop condition
```

```
unfold data. xapps. x
```

```
(* ---- loop body -- ,
```

```
...
```

```
Qed.
```

**40 lines of proofs +
8 lines of invariants**

**15 seconds
to check**

Example of a proof obligation

```
Pos : nonnegative_edges G
Ns : s \in nodes G
Ne : e \in nodes G
Neg : nodes_index G n
Adj : forall x y w : int,
      x \in nodes G -> Mem (y, w) (N\(x)) = has_edge G x y w
Nx : x \in nodes G
Vx : ~ V\(x)
Dx : Finite dx = dist G s x
Inv : inv G n s V' B Q (new_crossing G s x L' V)
EQ : N\(x) = rev L' ++ (y, w) :: L
Ew : has_edge G x y w
Ny : y \in nodes G
```

well-named hypotheses

(1/6)

```
(Let dy := Ret dx + w in
  Let _x38 := App ml_array_get b y ; in
    If_Match
      (Case _x38 = Finite d [d] Then Ret (dy '< d) Else
       (Case _x38 = Infinite Then Ret true Else Done))
    Then (App ml_array_set b y (Finite dy) ;) ;;
    App push (y, dy) h ; Else (Ret tt))
```

char. formula

pre-condition

```
(q ~> Pqueue Q \* b ~> Array B \* v ~> Array V' \* g ~> Array N)
```

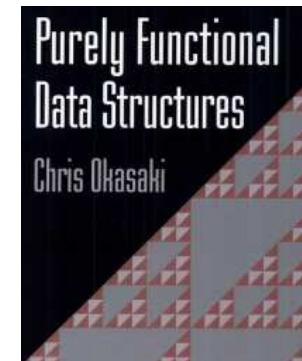
```
(fun _:unit => hinv' L)
```

post-condition

Programs verified

Purely functional data structures:

examples from Okasaki's book, including red-black trees, splay heaps, binomial heaps, pairing heaps, realtime queues, bootstrapped queues, random access lists



Imperative algorithms & data structures: dijkstra's shortest path, mutable lists, union-find, sparse arrays

Interaction between effects and functions:

- higher-order iterators on mutable structures (iter)
- closure with private local state (counter function)
- CPS functions (Reynold's CPS-append challenge)
- recursion through the store (Landin's knot)

Example of specification

$$t = \text{let } x = \underbrace{!r + 1}_{t_1} \text{ in } \underbrace{s := x + 2}_{t_2}$$

$$H = (r \sim\sim> 3) \ \backslash * \ (s \sim\sim> 9)$$

$$Q' = \text{fun } v \Rightarrow [v = 4] \ \backslash * \ (r \sim\sim> 3) \ \backslash * \ (s \sim\sim> 9)$$

The Hoare triple $\{H\} t_1 \{Q'\}$ is true

$$Q' \ x = [x = 4] \ \backslash * \ (r \sim\sim> 3) \ \backslash * \ (s \sim\sim> 9)$$

$$Q = \text{fun } _:\text{unit} \Rightarrow (r \sim\sim> 3) \ \backslash * \ (s \sim\sim> 6)$$

The Hoare triple $\{Q' \ x\} t_2 \{Q\}$ is true

Thus, the Hoare triple $\{H\} t \{Q\}$ is true

CF for let-expressions

Rule:

$$\frac{\{H\} t_1 \{Q'\} \quad \forall x. \{Q' x\} t_2 \{Q\}}{\{H\} (\text{let } x = t_1 \text{ in } t_2) \{Q\}}$$

Goal: $\forall H. \forall Q. \llbracket t \rrbracket H Q \iff \{H\} t \{Q\}$

Definition:

$$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket \equiv$$

$$\lambda H. \lambda Q. \exists Q'. \llbracket t_1 \rrbracket H Q' \wedge \forall x. \llbracket t_2 \rrbracket (Q' x) Q$$

Notation system for CF

CF for let-binding:

$$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket \equiv$$

$$\lambda H. \lambda Q. \exists Q'. \llbracket t_1 \rrbracket H Q' \wedge \forall x. \llbracket t_2 \rrbracket (Q' x) Q$$

Definition of a Coq notation:

$$(\mathbf{Let } x = \mathcal{F}_1 \mathbf{ in } \mathcal{F}_2) \equiv$$

$$\lambda H. \lambda Q. \exists Q'. \mathcal{F}_1 H Q' \wedge \forall x. \mathcal{F}_2 (Q' x) Q$$

CF for let-binding, reformulated:

$$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket \equiv (\mathbf{Let } x = \llbracket t_1 \rrbracket \mathbf{ in } \llbracket t_2 \rrbracket)$$

→ **translate a source code into a logical predicate**

Summary of CF generation

$\llbracket v \rrbracket$	\equiv	Ret v
$\llbracket f v \rrbracket$	\equiv	App $f v$
$\llbracket \text{if } v \text{ then } t_1 \text{ else } t_2 \rrbracket$	\equiv	If v then $\llbracket t_1 \rrbracket$ else $\llbracket t_2 \rrbracket$
$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket$	\equiv	Let $x = \llbracket t_1 \rrbracket$ in $\llbracket t_2 \rrbracket$
$\llbracket \text{let rec } f x = t_1 \text{ in } t_2 \rrbracket$	\equiv	Let rec $f x = \llbracket t_1 \rrbracket$ in $\llbracket t_2 \rrbracket$
$\llbracket \text{crash} \rrbracket$	\equiv	Crash
$\llbracket \text{while } t_1 \text{ do } t_2 \rrbracket$	\equiv	While $\llbracket t_1 \rrbracket$ Do $\llbracket t_2 \rrbracket$
$\llbracket \text{for } i = a \text{ to } b \text{ do } t \rrbracket$	\equiv	For $i = a$ To b Do $\llbracket t \rrbracket$

- Characteristic formulae are easy to generate
- Characteristic formulae are of linear size
- Characteristic formulae read like source code
- The user never needs to unfold the definitions

Conclusion

- **A new, practical approach** to program verification
- **Soundness** and **completeness** proofs
- **Implementation:** CFML, from Caml to Coq
- **Examples:** verification can be achieved at fairly reasonable cost even for complex algorithms

The end!

Further information and examples: <http://arthur.chargueraud.org/>