

# Characteristic Formulae for the Verification of Imperative Programs

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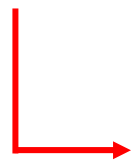
# Overview

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## Proving the correctness of arbitrarily-complex programs

→ take an existing program  
written, say, in Caml

→ specify and verify  
it using Coq



**characteristic formulae**



used to describe the semantics of the code in the logic

# Properties of characteristic formulae (CF)

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**characteristic formulae**



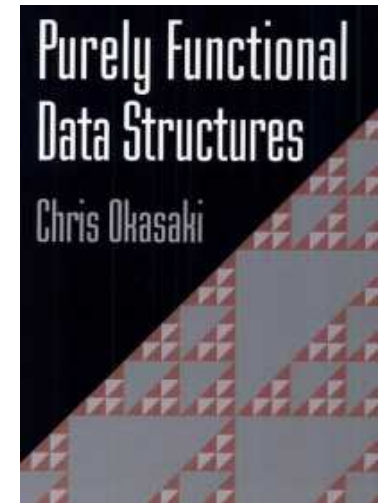
- CF are built automatically
- CF are built compositionally
- CF are of linear size
- CF are displayed in a way that resembles source code
- CF can be manipulated using solely high-level tactics
- CF are not just sound but also complete
- CF support local reasoning and modular verification

# Verification using CFML

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## Half of Okasaki's book

→ Batched queue, Bankers queue, Physicists queue, Real-time queue, Implicit queue, Bootstrapped queue, Hood-Melville queue, Leftist heap, Pairing heap, Lazy pairing heap, Splay heap, Binominal heap, Unbalanced set, Red-black set, Bottom-up merge sort, Catenable lists, Binary random-access lists



## Imperative higher-order programs

→ Dijkstra's shortest path algorithm, Counter generator, Append for mutable lists, CPS-append, Iterators on mutable lists, Sparse arrays, Union-Find, Composition function, Landin's knot (recursion through the store)

# Structure of the talk

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- (1) Introduction: what CF are and what they are not**
- (2) Example: verification of Dijkstra's algorithm**
- (3) Technical insight: how to construct CF**

# CF: what they are

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## Generation of characteristic formulae

$$C \longrightarrow \llbracket C \rrbracket$$

source code without any  
modification nor annotation

characteristic formula, expressed in  
higher-order logic using  $\forall, \exists, \wedge, \Rightarrow, \dots$

## CF are sound and complete w.r.t. Hoare logic

$$\forall H. \forall H'. \llbracket C \rrbracket H H' \iff \{H\} C \{H'\}$$

heap predicates  
(heap  $\rightarrow$  Prop)

application in  
higher-order logic

total correctness  
Hoare triple

$\rightarrow$  capturing that, in any heap satisfying  $H$ , the execution of the code  $C$  terminates and leaves a heap that satisfies  $H'$ .

# CF: what they are not

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- **Not a verification condition generator (VCG)**
  - the source code is not annotated with invariants
  - instead, invariants are provided in interactive proofs
- **Not a dynamic logic**
  - there is no ad-hoc logic construct to embed source code
  - allows to stay in a standard logic and use existing tools
- **Not a deep embedding**
  - no inductive datatype is used to represent code syntax
  - avoids low-level details and issues related to binders
- **Not a shallow embedding**
  - Caml functions are not represented as Coq functions
  - avoids a mismatch between partial and total functions

# Comparison with Ynot

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- **Heap predicates similar to those from Ynot**
- **Source language is Caml, not Coq + monad operators**
  - more flexible, in particular for binders
  - support verification of existing code
- **Verification is not established through type-checking the code with dependent types**
- **Auxiliary variables are never mixed with the code**



# Structure of the talk

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**(1) Introduction: what CF are and what they are not**

**(2) Example: verification of Dijkstra's algorithm**

→ source code

→ specification

→ invariant

→ main mathematical lemma

→ verification proof script

→ example of a proof obligation

**(3) Technical insight: how to construct CF**

# Source code

```
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 data structures

loop

pattern matching

higher-order function

abstract data structure (argument of the functor)

# Material generated by CFML

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`Axiom dijkstra : func.`

← `func` is the abstract data type  
used to represent functions

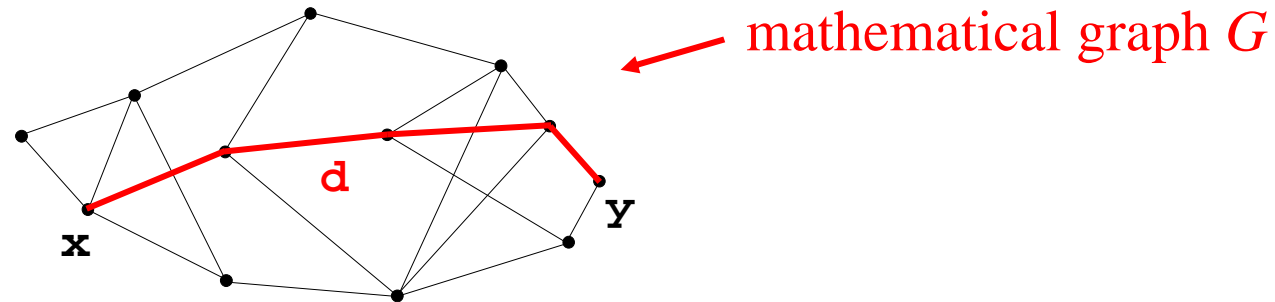
`Axiom dijkstra_cf :`

```
(@CFPrint.tag tag_top_fun __ (@CFPrint.tag tag_body __  
(forall K : (CFHeaps.loc -> (int -> (int -> ((CFHeaps.hprop  
-> ((__ -> CFHeaps.hprop) -> Prop))) -> Prop))), ((is_spec_3  
K) -> ((forall g : CFHeaps.loc, (forall s : int, (forall e :  
int, (((K g) s) e) (@CFPrint.tag tag_let_trm (Label_create  
'n) __ (local (fun H : CFHeaps.hprop => (fun Q : (__ ->  
CFHeaps.hprop) => (Logic.ex (fun Q1 : (int -> CFHeaps.hprop)  
=> ((Logic.and (((@CFPrint.tag tag_apply __ __ (((@app_1  
CFHeaps.loc) int) ml_array_length)...
```

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

→ These axioms are justified by the soundness theorem

# Specification for Dijkstra's shortest path



**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)`

application

pre-condition

post-condition

Remark: the representation predicate `GraphAdjList` is a user-defined predicate (it is not built in the system)

# Main invariant

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**Definition** `hinv Q B V : hprop :=`

```
  g ~> GraphAdjList G
  /* v ~> Array V
  /* b ~> Array B
  /* q ~> Pqueue Q
  /* [inv Q B V].
```

`G : graph int`  
`V : array bool`  
`B : array intbar`  
`Q : multiset (int*int)`

**Record** `inv Q B V : Prop := {`

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

# Main lemma about the 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 x ((y,w)::L) V)
  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 charact. formulae

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. tests (z = y).
(* case z = y *)
forwards~ (px&Px&Wx&Mx): (@mininf_finite ... (math ...))
lets Ny: (has_edge_in_nodes_r Ed).
sets p: ((x,y,w)::px).
asserts W: (weight p = dy). subst p. rewrite weight_cons. math.
tests (V'\(y)) as C; case_If as Nlt.
(* subcase y visisted, distance improved *)
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 across several lemmas  
(1/3 of the lines in this lemma)

8 seconds to type-check in Coq

# Proof script for Dijkstra's algorithm

Theorem dijkstra\_spec :  $\forall g x y G, \dots$  (App dijkstra g x y) ...

Proof.

```
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.
```

```
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 G s V)]).
```

```
xseq (# Hexists V, hinv (V,\{\})).
```

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

```
xwhile_inv W hinv. refine (ex_intro' (_,_)).
```

```
unfold hinv,data. hsimpl. applys_eq~ inv_start 2.
```

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

```
xextract as B Inv. xwhile_body.
```

```
unfold data. xapps. xret.
```

...

Qed.

specialized CFML  
tactic

loop invariant

termination  
measure

reference to one  
mathematic lemma

→ 48 lines of proofs, including 8 lines of invariants; checked in 8 seconds

# A typical 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,
      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
```

hypotheses

```
(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))
```

characteristic  
formula

pre-condition

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

```
(fun _:unit => hinv' L) ← post-condition
```



# Summary of CFML

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## **What you need to use CFML**

- learn Coq in case you don't know it yet
- learn about the 25 tactics specific to CFML
- take a Caml program and feed it to CFML
- write down the specification of the program
- write down the invariants of your program (hardest part)
- complete the proofs interactively

## **Not supported (yet)**

- modulo and floating-point arithmetics
- exceptions, objects and concurrency

# Structure of the talk

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(1) **Introduction: what CF are and what they are not**

(2) **Example: verification of Dijkstra's algorithm**

(3) **Technical insight: how to construct CF**

→ characteristic formula for sequences

→ function definitions and function calls

→ integration of the frame rule

# CF construction for sequence

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## Hoare logic rule for sequence

$$\frac{\{H\} C_1 \{H''\} \quad \{H''\} C_2 \{H'\}}{\{H\} (C_1 ; C_2) \{H'\}}$$

## Property of characteristic formulae

$$\forall H. \forall H'. \llbracket C_1 ; C_2 \rrbracket H H' \iff \{H\} (C_1 ; C_2) \{H'\}$$

## Characteristic formula for sequence

$$\llbracket C_1 ; C_2 \rrbracket \equiv \lambda H. \lambda H'. \exists H''. \llbracket C_1 \rrbracket H H'' \wedge \llbracket C_2 \rrbracket H'' H'$$

# Notation system for CF

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Definition from previous slide

$$\begin{aligned} \llbracket C_1 ; C_2 \rrbracket &\equiv \\ &\lambda H. \lambda H'. \exists H''. \llbracket C_1 \rrbracket H H'' \wedge \llbracket C_2 \rrbracket H'' H' \end{aligned}$$

Definition of a Coq notation

$$\begin{aligned} (\mathcal{F}_1 ;; \mathcal{F}_2) &\equiv \\ &\lambda H. \lambda H'. \exists H''. \mathcal{F}_1 H H'' \wedge \mathcal{F}_2 H'' H' \end{aligned}$$

Characteristic formula for sequence, revisited

$$\llbracket C_1 ; C_2 \rrbracket \equiv \llbracket C_1 \rrbracket ;; \llbracket C_2 \rrbracket$$

# Generalization

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**Other language constructs are handled in a similar way**

$$[[C_1 ; C_2]] \equiv [[C_1]] ;; [[C_2]]$$

$$[[\text{while } C_1 \text{ do } C_2]] \equiv \mathbf{While} \ [[C_1]] \ \mathbf{Do} \ [[C_2]]$$

...

**As a result:**

- CF are fully compositional
- CF are easy to generate
- CF are of linear size

Moreover, thanks to tactics, notation need not be unfolded

# Function definitions

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For the following definition

function  $f(x) \{C\}$

we generate two axioms

Axiom  $f$  : func.

Axiom  $F$  :  $\forall x H H'. \llbracket C \rrbracket H H' \Rightarrow \text{App } f x H H'$ .

where  $func$  is an abstract type and  $App$  an abstract predicate

func : Type

App :  $\forall A. \text{func} \rightarrow A \rightarrow (\text{Heap} \rightarrow \text{Prop}) \rightarrow (\text{Heap} \rightarrow \text{Prop}) \rightarrow \text{Prop}$

Characteristic formula for function calls

$\llbracket f(v) \rrbracket \equiv \lambda H. \lambda H'. \text{App } f v H H'$

## Example of a recursive function

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**We don't need to add anything to support recursion: the specification of a recursive functions can be proved by induction, using Coq's induction principles**

Consider the following recursive function

function  $f(n)$  { if  $n > 0$  then {  $x := x + 1$ ;  $f(n - 1)$  } }

We prove its specification by induction on  $n$

$$\forall n. \forall a. n \geq 0 \Rightarrow \text{App } f \ n \ (x \hookrightarrow a) \ (x \hookrightarrow a + n)$$

# Frame rule

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The frame rule is not syntax directed; how to integrate it?

$$\frac{\{H_1\} C \{H'_1\}}{\{H_1 * H_2\} C \{H'_1 * H_2\}}$$

Insert a predicate at the head of every node in the CF

$$[[C_1 ; C_2]] \equiv \text{local} (\lambda H. \lambda H'. \dots)$$

This *local* predicate supports application of the frame rule at any time and it can be eliminated by framing the empty heap

$$\text{local } \mathcal{F} \equiv \lambda H. \lambda H'. \exists H_1 H'_1 H_2. \begin{cases} \mathcal{F} H_1 H'_1 \\ H = H_1 * H_2 \\ H' = H'_1 * H_2 \end{cases}$$



# Further information

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## Homepage

- examples at <http://arthur.chargueraud.org/softs/cfml>
- download and try CFML (open source)

## ICFP'11 paper

- more on how to build characteristic formulae
- examples of first-class imperative functions

## Thesis

- more on representation predicates (e.g., GraphAdjList)
- proofs of soundness and completeness

**Thanks!**