

# Verification of Imperative Programs Through Characteristic Formulae

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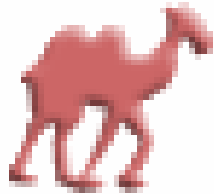
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# The big picture

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**Caml**

**Source code  
not annotated**

**Automatic  
generation**



**Coq**

**Characteristic  
formulae**

**Interactive  
proofs**



**Specification  
& verification**

# Characteristic formulae

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**Total correctness Hoare triple:** under the pre-condition  $H$ , the term  $t$  terminates and produces a value  $v$  such that  $(Q\ v)$  describes the post-condition.

$$\{H\} t \{Q\}$$

**Characteristic formula, written  $\llbracket t \rrbracket$ , such that:**

$$\llbracket t \rrbracket H Q \iff \{H\} t \{Q\}$$

**higher-order logic predicate,  
pretty-printed like the term  $t$**

**program  
syntax**

Characteristic formula :  $\text{Hprop} \rightarrow (\text{T} \rightarrow \text{Hprop}) \rightarrow \text{Prop}$ ,  
where  $\text{Hprop} = \text{Heap} \rightarrow \text{Prop}$ .

# CF for let-expressions

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

**Characteristic formula:**

$$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket \equiv \lambda H. \lambda Q. \exists Q'. \llbracket t_1 \rrbracket H Q' \wedge \forall x. \llbracket t_2 \rrbracket (Q' x) Q$$

**Introduction of notation:**

$$(\text{let } x = \mathcal{F}_1 \text{ in } \mathcal{F}_2) \equiv \lambda H. \lambda Q. \exists Q'. \mathcal{F}_1 H Q' \wedge \forall x. \mathcal{F}_2 (Q' x) Q$$

**Characteristic formula generator:**

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

# CF generation

---

**A similar trick applies for other constructions:**

$\llbracket v \rrbracket$	$\equiv$	return $v$
$\llbracket f v \rrbracket$	$\equiv$	app $f v$
$\llbracket \text{crash} \rrbracket$	$\equiv$	crash
$\llbracket \text{if } v \text{ then } t_1 \text{ else } t_2 \rrbracket$	$\equiv$	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 $\llbracket t_2 \rrbracket$
$\llbracket \text{while } t_1 \text{ do } t_2 \rrbracket$	$\equiv$	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 $\llbracket t \rrbracket$

**CF: easy to generate, compositional, easy to read**

$$\{H\} t \{Q\} \iff \llbracket t \rrbracket H Q \iff \mathbf{t} H Q$$

# Integration of the frame rule

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**Hoare logic:** 
$$\frac{\{H_1\} t \{Q_1\}}{\{H_1 * H_2\} t \{Q_1 \star H_2\}}$$

where  $Q_1 \star H_2$  is defined as “ $\lambda v. (Q_1 v) * H_2$ ”

**Updated definition:**

$$(\text{let } x = \mathcal{F}_1 \text{ in } \mathcal{F}_2) \equiv \text{frame } (\lambda H. \lambda Q. \exists Q'. \mathcal{F}_1 H Q' \wedge \forall x. \mathcal{F}_2 (Q' x) Q)$$

**Predicate presentation:**

$$\text{frame } \mathcal{F} \equiv \lambda H Q. \exists H_1 H_2 Q_1. \begin{cases} H = H_1 * H_2 \\ \mathcal{F} H_1 Q_1 \\ Q = Q_1 \star H_2 \end{cases}$$

The predicate "local" generalizes "frame". It supports the rules of consequence and of garbage collection, as well as extraction of quantifiers and propositions.

# Translation of types

---

The Caml type **T** is reflected as the Coq type  $\langle \mathbf{T} \rangle$

$$\begin{aligned}\langle \text{int} \rangle &\equiv \text{Int} \\ \langle \tau_1 \times \tau_2 \rangle &\equiv \langle \tau_1 \rangle \times \langle \tau_2 \rangle \\ \langle \tau_1 + \tau_2 \rangle &\equiv \langle \tau_1 \rangle + \langle \tau_2 \rangle \\ \langle \tau_1 \rightarrow \tau_2 \rangle &\equiv \text{Func} \\ \langle \text{ref } \tau \rangle &\equiv \text{Loc}\end{aligned}$$

- A value of type **Func** corresponds to the source code of a well-typed Caml function
- A **Heap** is a map from type **Loc** to dependent pairs made of a type and a value of that type

Observe: no negative-occurrence of recursive types

# CF for function applications

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**AppReturns**  $f v H Q$  states that the application of  $f$  to  $v$  admits pre-condition  $H$  and post-condition  $Q$ .

**Example:** (App is the same as AppReturns for arity 1)

```
(App incr r;) (r ~~> n) (fun _ => r ~~> n+1)
```

**Type of AppReturns:**

$$\forall A B. \text{Func} \rightarrow A \rightarrow \text{Hprop} \rightarrow (B \rightarrow \text{Hprop}) \rightarrow \text{Prop}$$

**Characteristic formulae for applications:**

$$\llbracket f v \rrbracket H Q \quad \Leftrightarrow \quad \text{AppReturns } f v H Q$$
$$\llbracket f v \rrbracket \quad \equiv \quad \text{AppReturns } f v$$



# CF for function definitions

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## Instances of the predicate AppReturns:

- have to be provided for reasoning on applications
- are given by the formula of a function definition

## Instances generated for $\text{let rec } f \ x = t$

$$\forall x \ H' \ Q'. \llbracket t \rrbracket \ H' \ Q' \Rightarrow \text{AppReturns } f \ x \ H' \ Q'$$

## Characteristic formulae for functions:

$$\llbracket \text{let } f \ x = t \text{ in } t' \rrbracket \equiv \lambda H Q. \forall f. (\forall x \ H' \ Q'. \llbracket t \rrbracket \ H' \ Q' \Rightarrow \text{AppReturns } f \ x \ H' \ Q') \Rightarrow \llbracket t' \rrbracket \ H \ Q$$

Recursive functions are proved correct by induction

# Characteristic formula generation

$$\llbracket v \rrbracket \equiv \text{local } (\lambda H Q. H \triangleright Q v)$$

$$H_1 \triangleright H_2 \text{ is } \mathbf{H1} \implies \mathbf{H2}$$

$$\llbracket f v \rrbracket \equiv \text{local } (\lambda H Q. \text{AppReturns } f v H Q)$$

$$\llbracket \text{crash} \rrbracket \equiv \text{local } (\lambda H Q. \text{False})$$

$$\llbracket \text{if } v \text{ then } t_1 \text{ else } t_2 \rrbracket \equiv \text{local } (\lambda H Q. (v = \text{true} \Rightarrow \llbracket t_1 \rrbracket H Q) \wedge (v = \text{false} \Rightarrow \llbracket t_2 \rrbracket H Q))$$

$$\llbracket \text{let } x = t_1 \text{ in } t_2 \rrbracket \equiv \text{local } (\lambda H Q. \exists Q'. \llbracket t_1 \rrbracket H Q' \wedge \forall x. \llbracket t_2 \rrbracket (Q' x) Q)$$

$$\llbracket \text{let } f x = t_1 \text{ in } t_2 \rrbracket \equiv \text{local } (\lambda H Q. \forall f. \mathcal{H} \Rightarrow \llbracket t_2 \rrbracket H Q)$$

where  $\mathcal{H}$  is  $(\forall x H' Q'. \llbracket t_1 \rrbracket H' Q' \Rightarrow \text{AppReturns } f x H' Q')$

# Incrementation function

---

## CamL source code:

```
let incr r =  
  r := !r + 1
```

## Normalized CamL code:

```
let incr r =  
  let x = get r in  
  set r (x+1)
```

## Generated Coq definitions:

```
Axiom incr : Func.
```

```
Axiom incr_cf :  $\forall$  (r:loc) (H:Hprop) (Q:unit->Hprop),  
  (Let x = App get r; in App set r (x+1)) H Q ->  
  (App incr r;) H Q.
```

behind the scene:  $\wedge, \Rightarrow, \forall, \exists, \dots$

# Incr: verification (1/2)

---

**Lemma** `incr_spec` :  $\forall$  (r:loc) (n:int),  
 (`App` `incr` r;)  $\underbrace{(r \sim\sim> n)}_{\text{Hprop}}$   $\underbrace{(\text{fun } \_ \Rightarrow r \sim\sim> n+1)}_{\text{unit} \rightarrow \text{Hprop}}$ .

**Proof.** `xcf.` `xlet.` `xapp.` `xextract.` `xapp.` `xsimpl.` `Qed.`

---

(r:loc) (n:int) **xcf**  
|- (`Let` x = `App` `get` r; `in` `App` `set` r (x+1);)  
 (r  $\sim\sim>$  n) (# r  $\sim\sim>$  n+1).

---

(r:loc) (n:int) **xlet**  
|- (`App` `get` r) (r  $\sim\sim>$  n) ?Q.  
  
(r:loc) (n:int) (x:int)  
|- (`App` `set` r (x+1);) (?Q x) (# r  $\sim\sim>$  n+1).

---

?Q = (fun a => [a = n] \\* r  $\sim\sim>$  n) **xapp**

---

**Lemma** `get_spec` :  $\forall$  (A:Type) (r:loc) (v:A),  
 (`App` `get` r;) (r  $\sim\sim>$  v) (fun a => [a = v] \\* r  $\sim\sim>$  v)

# Incr: verification (2/2)

---

```
(r:loc) (n:int) (x:int)
|- (App set r (x+1);) ([x = n] \* r ~~> n) (# r ~~> n+1).
```

---

```
(r:loc) (n:int) (x:int) (H: x = n) xextract
|- (App set r (x+1)) (r ~~> n) (# r ~~> n+1).
```

---

```
(r:loc) (n:int) (x:int) (H: x = n) xapp
|- (r ~~> x+1) ==> (r ~~> n+1).
```

---

```
(r:loc) (n:int) (x:int) (H: x = n) xsimpl
|- (x+1) = (n+1)
```

---

```
Lemma set_spec :  $\forall$  (A:Type) (r:loc) (u:A) (v:A),
  (App set r v;) (r ~~> u) (# r ~~> v).
```

# Incr: summary

---

## Specification:

`Lemma incr_spec :  $\forall$  (r:loc) (n:int),  
 (App incr r;) (r  $\sim\sim$ > n) (# r  $\sim\sim$ > n+1).`

## Verification:

`Proof. xcf. xlet. xapp. xextract. xapp. xsimpl. Qed.`

`Proof. xcf. xapp. xapp. xsimpl. Qed.`

`Proof. xgo*. Qed.`

## Specification with "Spec" notation:

`Lemma incr_spec :  
 Spec incr (r:int) |R>>  $\forall$ n, R (r  $\sim\sim$ > n) (# r  $\sim\sim$ > n+1).`

# Automated framing

(a:loc) (x:int) (b:loc) (y:int)

|- (App incr b;) (a  $\rightsquigarrow$  x \\* b  $\rightsquigarrow$  y) ?Q

**xapp:** should unify ?Q with # (a  $\rightsquigarrow$  x \\* b  $\rightsquigarrow$  y+1)

**Lemma** incr\_spec :

Spec incr (r:int) |R>>  $\forall n, R$  (r  $\rightsquigarrow$  n) (# r  $\rightsquigarrow$  n+1)

R (b  $\rightsquigarrow$  ?n) (# b  $\rightsquigarrow$  ?n+1)

(1) (a  $\rightsquigarrow$  x) \\* (b  $\rightsquigarrow$  y)  $\implies$  (b  $\rightsquigarrow$  ?n) \\* ?H

(2) (# b  $\rightsquigarrow$  ?n+1) \\*+ ?H  $\implies$  ?Q

From (1) deduce ?n = y and ?H = (a  $\rightsquigarrow$  x)

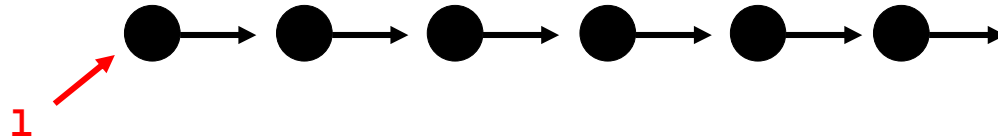
Then (2) becomes

(# b  $\rightsquigarrow$  y+1) \\*+ (a  $\rightsquigarrow$  x)  $\implies$  ?Q

Thus we deduce ?Q = # (b  $\rightsquigarrow$  y+1 \\* a  $\rightsquigarrow$  x)

# Length of mutable lists

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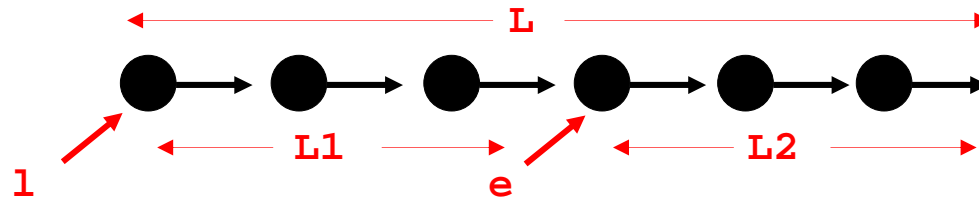
```
> type 'a mlist = { hd : 'a; tl : 'a mlist } (*or null*)
> let mlength (l:'a mlist) =
>   let h = ref l in
>   let n = ref 0 in
>   while !h != null do
>     incr n;
>     h := !h.tl;
>   done;
>   !n
```

```
Lemma mlength_spec :  $\forall(A:\text{Type}),$   
  Spec mlength (l:loc) |R>>  $\forall(L:\text{list } A),$   
    keep R (l ~> MList L) (\= length L)
```

```
R (l ~> MList L) (fun x => [x = length L] \* l ~> MList L)
```

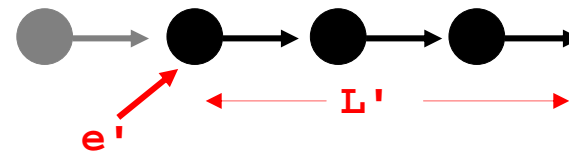
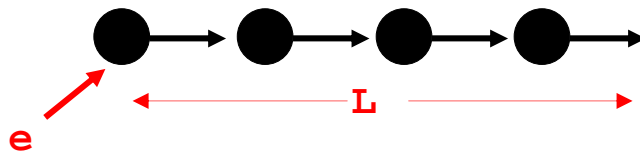


# Loop invariants... or not



**Loop invariant:** (indexed by L2)

```
fun L2 =>  
  Hexists L1 e,  
  [L = L1 ++ L2] \* (n ~~> length L1) \* (h ~~> e)  
  \* (l ~> MListSeg e L1) \* (e ~> MList L2))
```



**Recursive presentation:**

```
forall L e k,  
R ((h ~~> e) \* (e ~> Mlist L) \* (n ~~> k))  
(# (h ~~> null) \* (e ~> MList L) \* (n ~~> k+length L))
```

# Verification of mlength

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```
Lemma mlength_spec : forall a,  
  Spec mlength (l:mlist a) |R>> forall A (T:A->a->Hprop) (L:list A),  
  keep R (l ~> MList T L) (\= length L).
```

Proof.

```
xcf. intros. xapp. xapp.  
xwhile (forall L l k,  
  R (n ~-> k \* h ~-> l \* l ~> MList T L)  
  (# n ~-> (k + length L) \* h ~-> null \* l ~> MList T L)).  
appls (>> Inv l). hsimp1.  
clear l L. intros L. induction_wf IH: (@list_sub_wf A) L; intros.  
appls (rm HR). xlet. xapps. xapps. xifs.  
(* case cons *)  
xchange (MList_not_null l) as x l' X L' EL. auto.  
xapps. xapps. xapps. xapp. subst L. xappls~ (>> IH L' l').  
hsimpl. intros _. hchanges (MList_uncons l). rew_length. math.  
(* case nil *)  
subst. xchange MList_null_keep as M. subst.  
xrets. rew_length. math.  
xapp. hsimp1~.
```

Qed.

# CF for loops, with invariants

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**For-loop:** invariant of type "int  $\rightarrow$  Hprop"

$$\llbracket \text{for } i = a \text{ to } b \text{ do } t_1 \rrbracket \equiv \text{local } (\lambda H Q. \exists I. \left\{ \begin{array}{l} H \triangleright I a \\ \forall i \in [a, b]. \llbracket t_1 \rrbracket (I i) (\# I (i + 1)) \\ I (\max a (b + 1)) \triangleright Q tt \end{array} \right. )$$

**While-loop:** invariants of type "A  $\rightarrow$  Hprop" and of type "A  $\rightarrow$  bool  $\rightarrow$  Hprop", for some type A.

$$\llbracket \text{while } t_1 \text{ do } t_2 \rrbracket \equiv \text{local } (\lambda H Q. \left\{ \begin{array}{l} \text{well-founded}(\prec) \\ \exists X_0. H \triangleright I X_0 \\ \exists A. \exists I. \exists J. \exists (\prec). \left\{ \begin{array}{l} \forall X. \llbracket t_1 \rrbracket (I X) (J X) \\ \forall X. \llbracket t_2 \rrbracket (J X \text{ true}) (\# \exists Y. (I Y) * [Y \prec X]) \\ \forall X. J X \text{ false} \triangleright Q tt \end{array} \right. \end{array} \right. )$$

# CF for loops, recursive style

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**While-loop:**  $(R : \text{Hprop} \rightarrow (\text{unit} \rightarrow \text{Hprop}) \rightarrow \text{Prop})$

$$\llbracket \text{while } t_1 \text{ do } t_2 \rrbracket \equiv \\ \text{local } (\lambda H Q. \forall R. \text{is\_local } R \wedge \mathcal{H} \Rightarrow R H Q)$$

$$\text{with } \mathcal{H} \equiv \forall H' Q'. \llbracket \text{if } t_1 \text{ then } (t_2; |R|) \text{ else } tt \rrbracket H' Q' \Rightarrow R H' Q'$$

**For-loop:**  $(S : \text{int} \rightarrow \text{Hprop} \rightarrow (\text{unit} \rightarrow \text{Hprop}) \rightarrow \text{Prop})$

$$\llbracket \text{for } i = a \text{ to } b \text{ do } t \rrbracket \equiv \\ \text{local } (\lambda H Q. \forall S. \text{is\_local}_1 S \wedge \mathcal{H} \Rightarrow S a H Q)$$

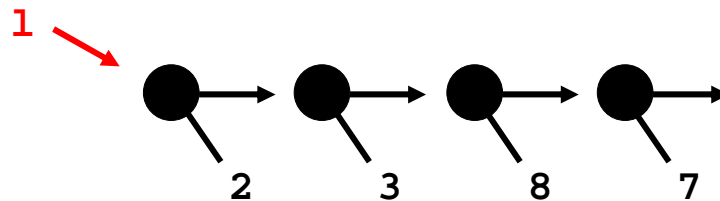
$$\text{with } \mathcal{H} \equiv$$

$$\forall i H' Q'. \llbracket \text{if } i \leq b \text{ then } (t; |S(i+1)|) \text{ else } tt \rrbracket H' Q' \Rightarrow S i H' Q'$$

# Representation predicates

**A representation predicate  $T$  relates a Caml value with its Coq representation**

```
Lemma mlength_spec :  $\forall$  (a:Type),  
  Spec mlength (l:loc) |R>>  
   $\forall$  (A:Type) (T:A->a->Hprop) (L:list A),  
  keep R (l ~> MList T L) (\= length L)
```



```
l ~> MList Id (2::3::8::7::nil)
```

**List of integers ( $a = A = \text{int}$ ):**  $l \sim> \text{MList Id}_{\text{int}} L$

where  $L : \text{list int}$  and  $L = 2::3::8::7::\text{nil}$

```
Definition Id (A:Type) (x:A) (X:A) : hprop := [x = X].
```

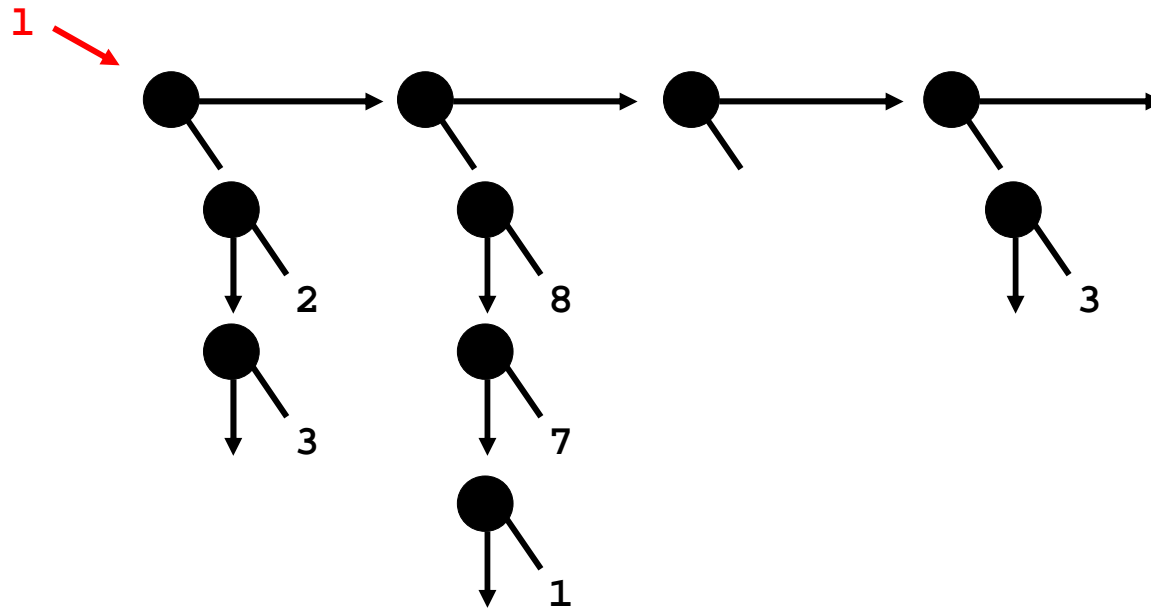
# Recursive ownership

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**List of lists of integers:**  $I \sim > \text{Mlist} (\text{Mlist } \text{Id}_{\text{int}}) L$

where  $L : \text{list} (\text{list } \text{int})$

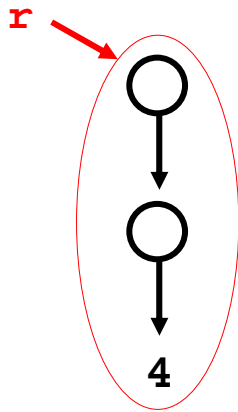
and  $L = (2::3::\text{nil})::(8::7::1::\text{nil})::\text{nil}::(3::\text{nil})::\text{nil}$



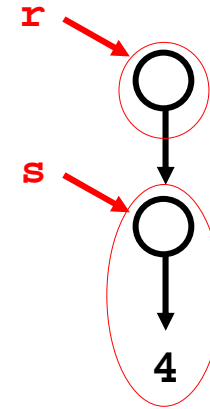
Recursive ownership is useful to describe tree-shaped mutable data structures

# Reference on a reference

$r \sim> \text{Ref } (\text{Ref } \text{Id}_{\text{int}}) 4$



$r \sim> \text{Ref } \text{Id}_{\text{loc}} s$   
 $\backslash * s \sim> \text{Ref } \text{Id}_{\text{int}} 4$



**Reading and writing is restricted to "Id" fields:**

Spec get  $r \mid R \gg \forall v, \text{ keep } R \underbrace{(r \sim> \text{Ref } \text{Id } v)}_{(r \sim\sim> v)} (\backslash = v)$

**Conversion lemma:**

$(r \sim> \text{Ref } T X) = (\text{Hexists } x, r \sim> \text{Ref } \text{Id } x \backslash * x \sim> T X)$

# Representation predicates

---

## Tagged application:

$$x \sim> U \quad \Leftrightarrow \quad \text{hdata } U \ x \quad \Leftrightarrow \quad U \ x$$

## Definition of "Ref":

```
Definition Ref (a A:Type) (T:A->a->Hprop) (l:loc) :=  
  Hexists x,      (heap_is_single l (ref_record x))  
    \* (x ~> T X)
```

## Generated material for records:

- representation predicate,
- conversion lemmas
- create, get and set specifications



# Conversion lemmas for MList

---

```
Fixpoint MList a A (T:A->a->hprop) (L:list A) (l:loc) :=  
  match L with  
  | nil => [l = null]  
  | X::L' => l ~> Mlist T (MList T) X L'  
end.
```

## Conversion lemmas:

```
(l ~> MList T nil) = [l = null]
```

```
(l ~> MList T (X::L)) =  
  (Hexists x t, l ~> Mlist Id Id x t  
    \* x ~> T X  
    \* t ~> MList T L)
```

```
(null ~> MList T L) = [L = nil]
```

etc...

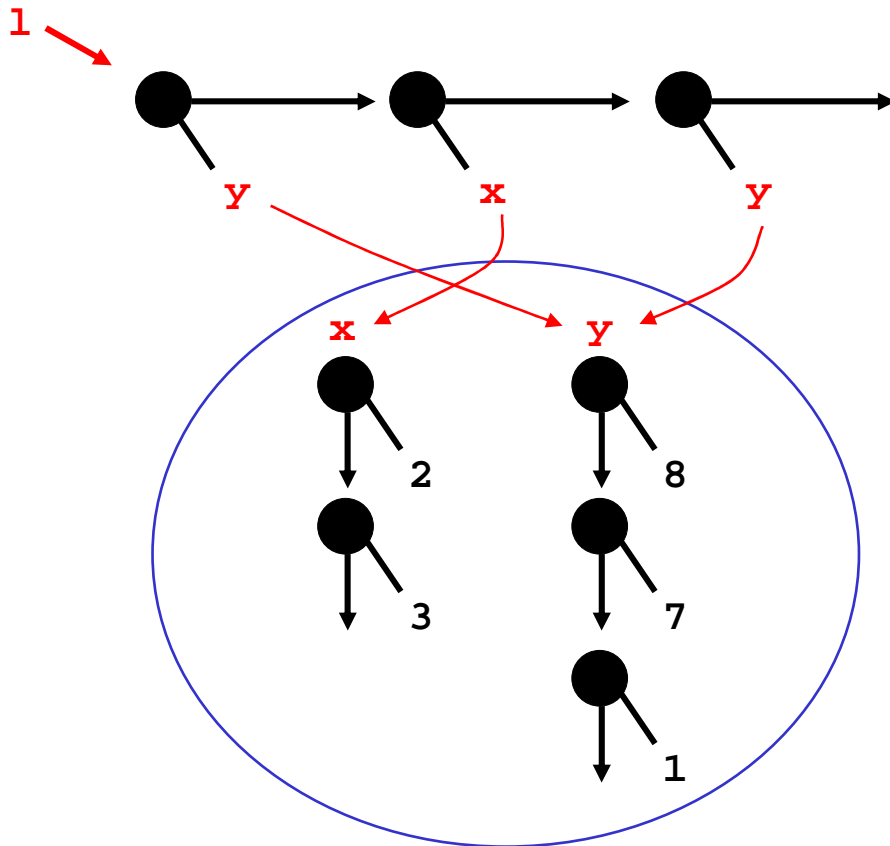
## Reading the head of a mutable list:

```
Spec mlist_hd l |R>>  $\forall$  x t,  
  keep R (l ~> Mlist Id Id x t) (\= x).
```

# Aliasing with groups

**List of aliased lists of integers:**  $I \rightsquigarrow \text{Mlist Id}_{\text{loc}} L$

where  $L : \text{list loc}$  and  $L = y :: x :: y :: \text{nil}$



**Group predicate:**

$\text{Group (MList Id}_{\text{int}}) M$

where  $M : \text{map loc (list int)}$

and  $M[x] = 2 :: 3 :: \text{nil}$

and  $M[y] = 8 :: 7 :: 1 :: \text{nil}$

# Operation on groups

---

## Insertion and removal for groups:

**Lemma** `Group_add` :  
 `Group T M \* (x ~> T X)`  
`= Group T (M\ (x:=X))`.

**Lemma** `Group_rem` : `x \indom M ->`  
 `Group T M`  
`= Group T (M \-- x) \* (x ~> T (M\ (x)))`.

## Derived operations for groups of references:

**Spec** `get (l:loc) |R>>`  
 `\(M:map loc A), l \indom M ->`  
 `keep R (Group (Ref Id) M) (\= M\ (l))`.

**Spec** `set (l:loc) (v:A) |R>>`  
 `\(M:map loc A), l \indom M ->`  
 `R (Group (Ref Id) M) (# Group (Ref Id) (M\ (l:=v)))`.

# Union-find data structure

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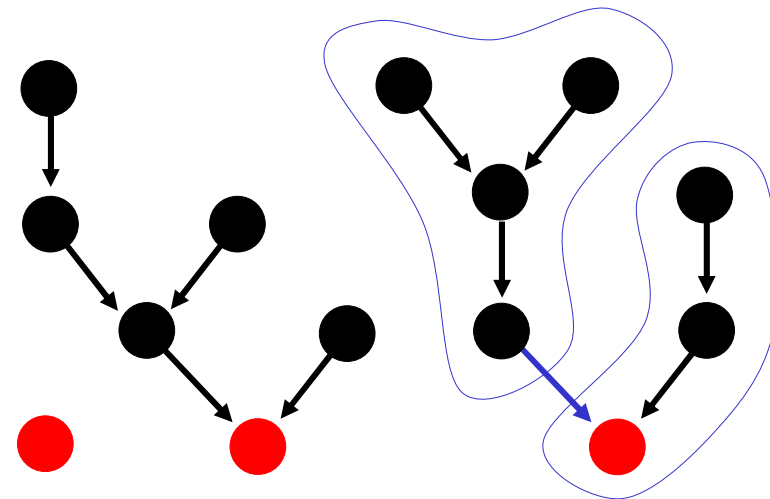
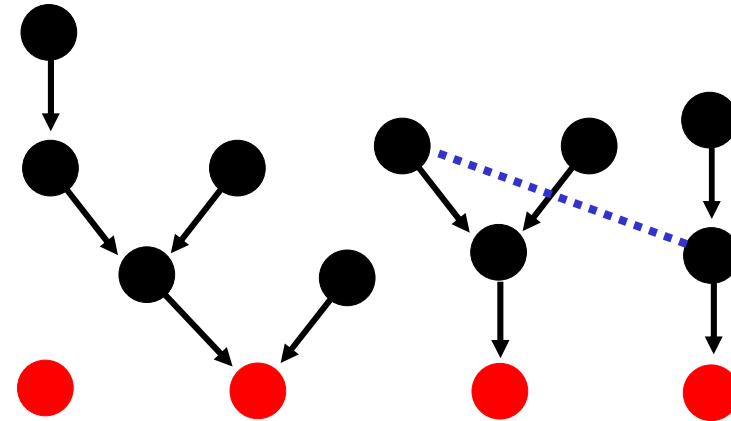
```
type cell = content ref
and content =
  Node of cell | Root
```

```
let rec repr x =
  match !x with
  | Root -> x
  | Node y -> repr y
```

```
let create () =
  ref Root
```

```
let same x y =
  repr x == repr y
```

```
let union x y =
  let rx = repr x in
  let ry = repr y in
  if rx != ry
  then rx := Node ry
```



# Union-find: invariants

---

```
Inductive is_repr (M:map loc content) : loc->loc->Prop:=  
| is_repr_root :  $\forall$  x,  
  binds M x Root -> is_repr M x x  
| is_repr_step :  $\forall$  x y r,  
  binds M x (Node y) -> is_repr M y r -> is_repr M x r.
```

```
Definition is_equiv M x y :=  
   $\exists$ r, is_repr M x r /\ is_repr M y r.
```

```
Definition is_forest M :=  
   $\forall$ x, x \indom M ->  $\exists$ r, is_repr M x r.
```

```
Definition UFgraph (G:graph loc) : Hprop :=  
  Hexists M, Group (Ref Id) M \*  
  [ is_forest M /\ dom M = nodes G  
    /\ is_equiv M = connected G ].
```

```
Definition connected A (G:graph A) : A->A->Prop :=  
  rstclosure (fun x y => (x,y) \in edges G).
```

# Union-find: connected components

---

```
Spec repr x |R>> forall M,  
  is_forest M -> x \indom M ->  
  keep R (Group (Ref Id) M) (fun r => [is_repr M x r])
```

```
Spec create () |R>> forall G,  
  R (UFgraph G) (fun r => [r \notin nodes G]  
    \* UFgraph (add_node G r)).
```

```
Spec same x y |R>> forall G,  
  x \in nodes G -> y \in nodes G ->  
  keep R (UFgraph G) (\= istrue (connected G x y)).
```

```
Spec union x y |R>> forall G,  
  x \in nodes G -> y \in nodes G ->  
  R (UFgraph G) (# UFgraph (add_edge G x y)).
```

# Union-find: partial equiv. relations

---

**Definition** `UF (B:binary loc): Hprop :=`  
`Hexists M, Group (Ref Id) M \* [ per B /\`  
`is_forest M /\ dom M = per_dom B /\ is_equiv M = B ].`

**Definition** `per_dom A (B:binary A) := \set{ x | B x x}.`

**Definition** `add_single A (B:binary A) (x:A) (y:A) :=`  
`stclosure (fun u v => B u v \/ (u=x /\ v=y)).`

**Spec** `create () |R>> forall B,`  
`R (UF B) (fun r => [r \notin per_dom B]`  
`\* UF (add_single B r r)).`

**Spec** `same x y |R>> forall B,`  
`x \in per_dom B -> y \in per_dom B ->`  
`keep R (UF B) (\= istrue (B x y)).`

**Spec** `union x y |R>> forall B,`  
`x \in per_dom B -> y \in per_dom B ->`  
`R (UF B) (# UF (add_single B x y)).`

# Union-find: verification

---

- Lemmas: 140 lines in 17 lemmas (14 inductions)
- Verification: 34 lines, invoking those lemmas

**Lemma** union\_spec :

```
Spec union x y |R>> forall B,  
  x \in per_dom B -> y \in per_dom B ->  
  R (UF B) (# UF (add_edge B x y)).
```

**Proof.**

```
xcf. introv Dx Dy. unfold UF. xextract as M (PM&FM&DM&EM).  
rewrite <- DM in *. xapp*. intros Rx. xapp*. intros Ry. xapps. xif.  
(* case [rx <> ry] *)  
xapp*. apply* is_repr_in_dom_r. hsimp1. splits.  
  apply* per_add_edge.  
  apply* is_forest_add_edge; apply* is_repr_binds_root.  
  rewrite per_dom_add_edge. rewrite <- DM.  
  rewrite* dom_update_in. set_eq*. forwards*: is_repr_binds_root Rx.  
  apply* inv_add_edge.  
(* case [rx = ry] *)  
xrets. splits*.  
  apply* per_add_edge.  
  rewrite per_dom_add_edge. rewrite <- DM. set_eq*.  
  rewrite* add_edge_already. rewrite* <- EM.
```

**Qed.**



# Composition function

---

```
> let compose g f x =  
>   g (f x)
```

The behavior of "`compose g f x`" is the same as that of "`g (f x)`", so "`compose g f x`" admits pre  $H$  and post  $Q$  if the characteristic formula of "`g (f x)`" holds of  $H$  and  $Q$ .

```
Lemma compose_spec : forall A B C,  
  Spec compose (g:Func) (f:Func) (x:A) |R>>  
     $\forall (H:hprop) (Q:C \rightarrow hprop),$   
    (Let y := App f x; in App g y;) H Q  $\rightarrow$  R H Q.
```

On the goal "`(App compose g f x;) H Q`", the tactic `xapp` produces "`(Let y := App f x; in App g y;) H Q`", just as if the code of `compose` had been inlined.

# Counter function

---

```
> let make_counter () =  
>   let r = ref 0 in  
>   let f () = incr r; !r in  
>   f
```

**Definition** CounterSpec I f :=  
Spec f () |R>>  $\forall m,$   
R (I m) ( $\backslash=(m+1) \backslash*+ (I (m+1))$ ).

**Definition** Counter (n:int) (f:func) : hprop :=  
Hexists (I:int->hprop), I n  $\backslash*$  [CounterSpec I f].

**Lemma** make\_counter\_spec :  
Spec make\_counter () |R>> R [] ( $\sim>$  Counter 0).

**Proof.**

```
xcf. xapps. sets I: (fun n:int => r  $\sim\sim>$  n).  
xfun (CounterSpec I). xgo*. unfold I. hsimpl.  
xret. hdata_simpl Counter. hsimpl~ I.
```

**Qed.**

# Calls to counter functions

---

**Lemma** Counter\_apply :  $\forall$  (f:Func) (n:int),  
 (App f tt;) (f ~> Counter n)  
 (\= (n+1) \\*+ f ~> Counter (n+1)).

```
> let step_all (l:(unit->int)list) =  
>   List.iter (fun f -> ignore (f())) l
```

**Lemma** step\_all\_spec :  
 Spec step\_all (l:list Func) |R>>  $\forall$ (L:list int),  
 R (l ~> List Counter L)  
 (# l ~> List Counter (map (fun i => i+1) L)).

# Specification of List.iter

---

`Spec iter (f:Func) (l0:list A) | R>>`

`∀ (H:Hprop) (Q:unit->Hprop),`

`(∀ (S:list A->Hprop->(unit->Hprop)->Prop),`

`is_local_1 S ->`

`(∀ l H' Q',`

`match l with`

`| nil => (Ret tt) H' Q'`

`| x::l' => ((App f x;) ;; S l') H' Q'`

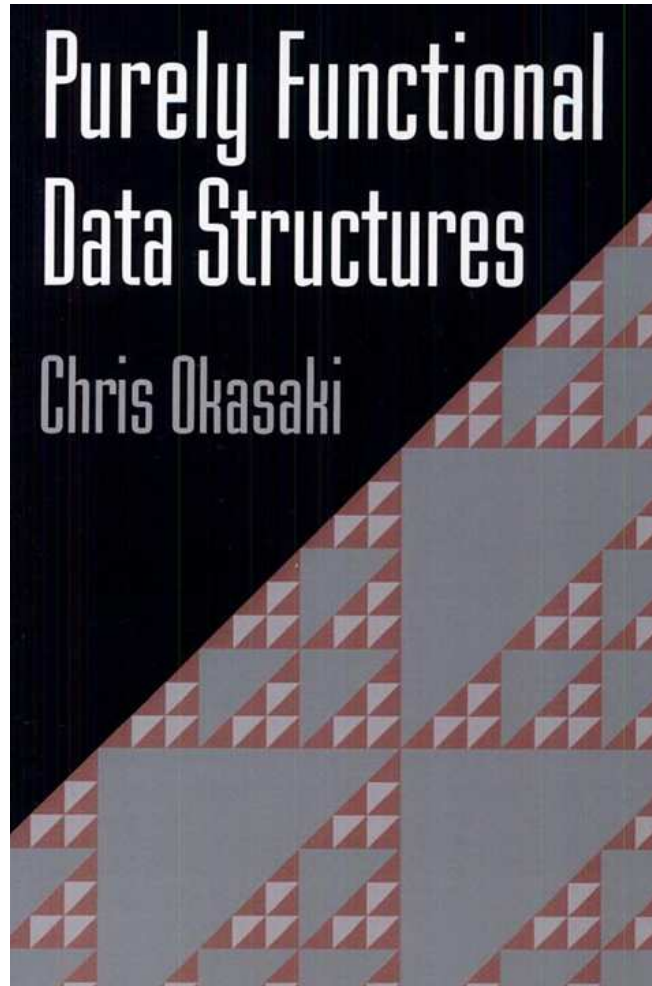
`end -> S l H' Q') ->`

`S l0 H Q) ->`

`R H Q.`

# Purely functional data structures

---



## **Formalized in particular:**

- red-black trees
- lazy queues
- realtime queues,
- bootstrapped queues
- splay heaps
- binomial heaps
- leftist heaps
- pairing heaps
- concatenable lists
- binary random access lists

# Code

---

```
module RedBlackSet (Element : Ordered) : Fset = struct
  type color = Red | Black
  type tree = Empty | Node of color * tree * elem * tree

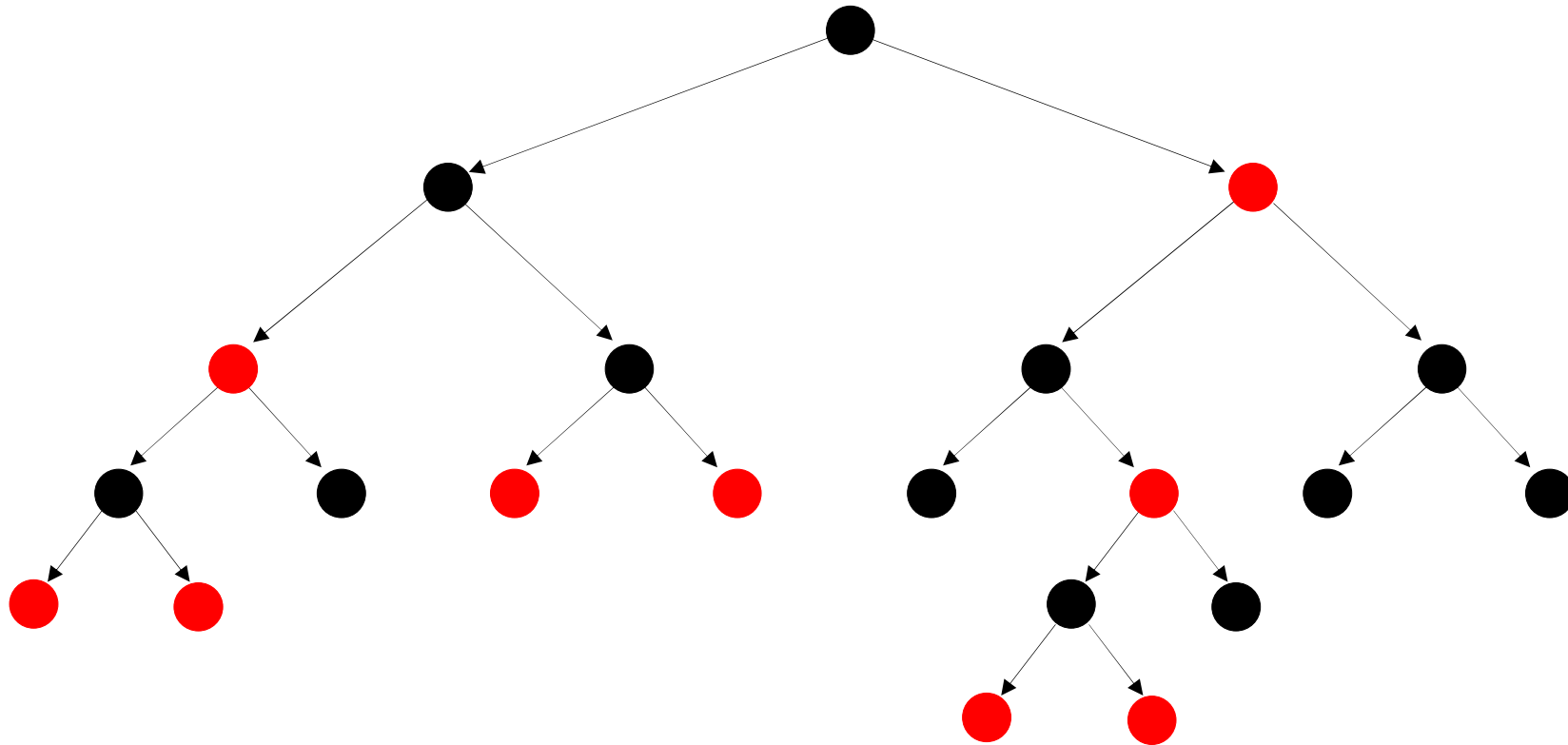
  let rec member x = function
  | Empty -> false
  | Node (_,a,y,b) -> if Element.lt x y then member x a
                      else if Element.lt y x then member x b else true

  let balance = function
  | (Black, Node (Red, Node (Red, a, x, b), y, c), z, d)
  | (Black, Node (Red, a, x, Node (Red, b, y, c)), z, d)
  | (Black, a, x, Node (Red, Node (Red, b, y, c), z, d))
  | (Black, a, x, Node (Red, b, y, Node (Red, c, z, d))) ->
    Node (Red, Node (Black, a, x, b), y, Node (Black, c, z, d))
  | (c,a,x,y) -> Node (c,a,x,y)

  let rec insert x s =
    let rec ins = function
    | Empty -> Node (Red, Empty, x, Empty)
    | Node (col, a, y, b) as s ->
      if Element.lt x y then balance (col, ins a, y, b)
      else if Element.lt y x then balance (col, a, y, ins b)
      else s in
    let Node (_, a, y, b) = ins s in Node (Black, a, y, b)
```

# Invariants of red-black trees

---



## **Binary search tree where:**

- 1) Same number of black nodes in every path
- 2) No red node has a red child
- 3) Root is always black

# Invariant for red-black trees

---

The invariant "`inv n t E`" holds if the tree `t` represents the set `E` and every path in `t` contains `n` black nodes.

```
Inductive inv : nat -> tree t -> set T -> Prop :=
| inv_empty : forall rok,
  inv 0 Empty \{\}
| inv_node : forall rok n m col a x b A X B,
  inv m a A -> inv m b B -> rep x X ->
  foreach (is_lt X) A -> foreach (is_gt X) B ->
  (n = match col with Black => m+1 | Red => m end) ->
  (match col with | Black => True
                 | Red => node_color a = Black
                        /\ node_color b = Black end) ->
  inv n (Node col a x b) (\{X} \u A \u B).
```

```
Instance tree_rep : Rep (tree t) (set T) := { rep :=
  fun e E => exists n, inv n e E /\ node_color e = Black }.
```



# Obligation

---

```
(x : elem) (X : OS.T) (ins : val) (n : nat) (col : color)
(a : tree) (y : elem) (b : tree) (A : set T) (Y : T)
(B : set T) (m : nat) (_a : tree) (s : tree)
InvA : inv m a A
InvB : inv m b B
RepX : rep x X
RepY : rep y Y
GtY : foreach (is_lt Y) A
LtY : foreach (is_gt Y) B
Col : match col with
  | Red => node_color a = Black /\ node_color b = Black
  | Black => True end
Num : n = match col with Red => m | Black => S m end
Es : s = Node col a y b
C1 : X < Y
P_a : inv m _a ('{X} \u A)
```

---

```
(App balance (col, _a, y, b);)
  (fun e' => inv n e' ('{X} \u '{Y} \u A \u B))
```

# Proof

---

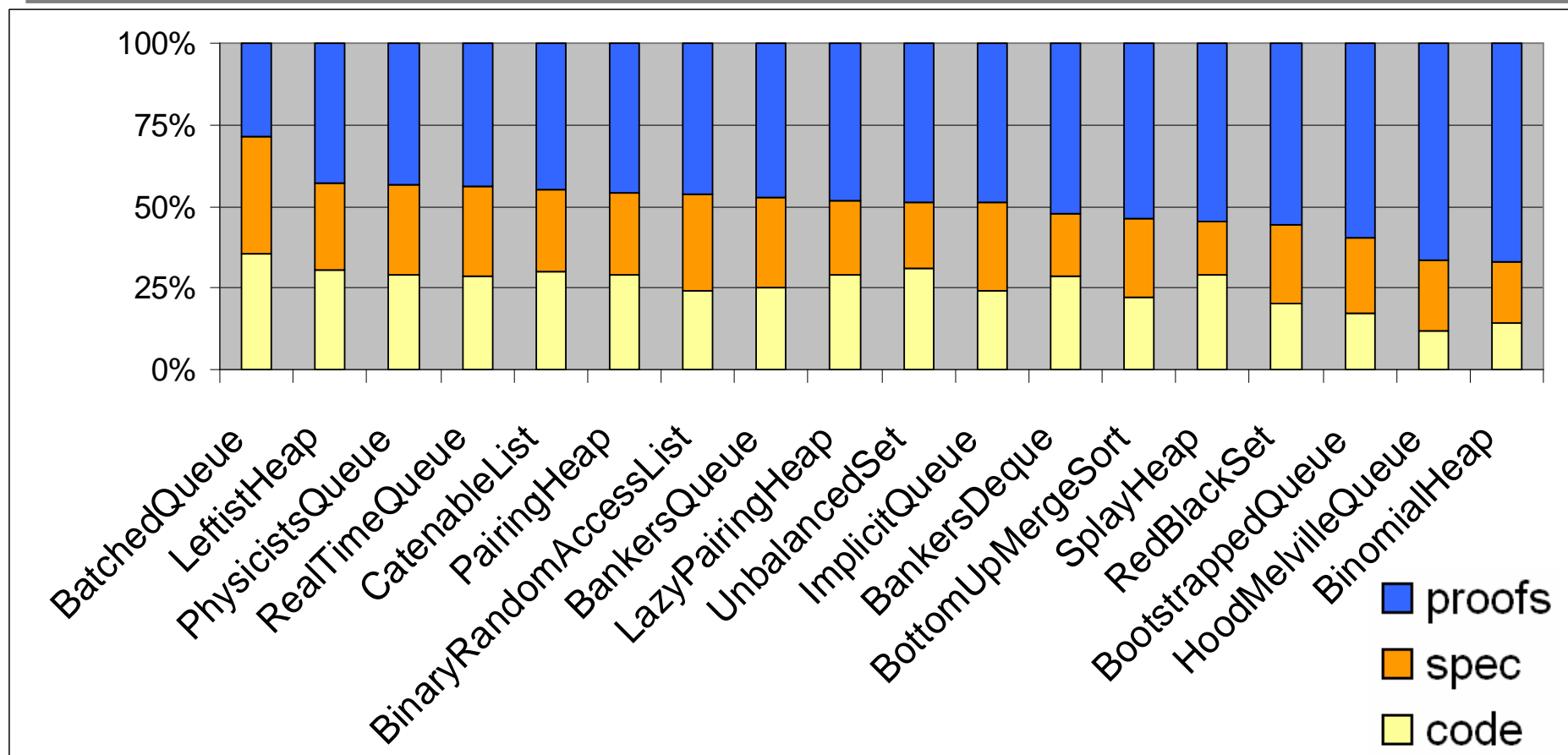
**Lemma** `insert_spec` : `RepTotal insert (X;elem) (E;set) |R>>`  
`R [] (= \{X} \u E ;; set).`

**Proof.**

```
xcf. introv RepX (n&InvE&HeB).
xfun_induction_nointro (ins_spec X) size.
clears s n E. intros e IH n E InvE. inverts InvE as.
xgo*. simpl. constructors~.
introv InvA InvB RepY GtY LtY Col Num. xgo~.
(* -- case insert left -- *)
destruct~ col; destruct (node_color a); tryifalse; auto.
ximpl as e. simpl. applys_eq~ Hx 1 3.
(* -- case insert right -- *)
destruct~ col; destruct (node_color b); tryifalse; auto.
ximpl as e. simpl. applys_eq~ Hx 1 3.
(* -- case no insertion -- *)
asserts_rewrite~ (X = Y). apply~ nlt_nslt_to_eq.
subst s. simpl. destruct col; constructors~.
xlet. xapp~. inverts P_x5; xgo. fset_inv. exists~.
```

**Qed.**

# Statistics Okasaki's book



Total: **564** non-blank lines of **Caml** (very concise code)  
**2489** non-blank lines of **Coq** (2min. to compile)

# Not presented in this talk

---

- General specifications for the swap function
- Landin's knot (recursion through the store)
- Sparse arrays (first task from VACID-0 challenge)
- Bytecode compiler and interpreter for mini-ML

# Additional features

---

## **Implemented but not discussed:**

- Curried n-ary functions
- Pattern matching
- Mutual recursion
- Polymorphism, polymorphic recursion
- Null pointers and strong updates
- Modules and functors

## **Not supported:**

- modulo arithmetics, real numbers (seems hard)
- catchable exceptions (future work)
- object-oriented programming (future work)
- nontrivial uses of laziness (future work)

# Verification Condition Generator

---

## **Idea:**

- annotate programs with specifications and invariants
- extract proof obligations that entail correctness
- discharge those obligations using SMT solvers

## **Difficulties:**

- hard to progress when SMT solvers fail
- hard to even read proof obligations

## **CF:**

- support interactive proofs with immediate feedback
- still some opportunity for automated reasoning

# Deep embedding

---

## **Idea:**

- axiomatize the syntax and semantics
- state theorem "such program admits such behavior"

## **Difficulties:**

- explicit substitution of program variables
- no identification between program and logical values

## **CF:**

- an abstract layer built on top of a deep embedding
- still identify program and logical variables and values

# Shallow embedding

---

## **Idea:**

- write programs in the logic of a proof assistant
- extract conventional purely-functional code

## **Difficulties:**

- logical functions must be total
- side-effects must be encoded in a monad
- can be hard to recognize ghost variables

## **CF:**

- no constraints on the programming language
- identify program and logical values except functions



# Characteristic formulae

---

## **Originates in process calculi:**

- a temporal-logic formula describes a process
- two processes are behaviorally equivalent if and only if their formulae are logically equivalent
- "characteristic" formula generation is automatable

## **Honda, Berger and Yoshida:**

- applied the idea to build program logics in which sound and complete formulae can be expressed
- described an algorithm for building weakest pre- and stronger post-conditions

## **CF:**

- target a standard logic, so leads to an effective tool
- exploit the strength of higher-order logic

# Soundness and completeness

---

**Soundness theorem:**  $\llbracket V \rrbracket$  takes Coq values into Caml

$$\left\{ \begin{array}{l} \vdash t : T \\ \llbracket t \rrbracket H Q \\ H h_i \\ h_i \perp h_k \end{array} \right. \Rightarrow \exists V h_f h_g. \left\{ \begin{array}{l} \vdash \llbracket V \rrbracket : T \\ t / \llbracket h_i \rrbracket + \llbracket h_k \rrbracket \Downarrow \llbracket V \rrbracket / \llbracket h_f \rrbracket + \llbracket h_k \rrbracket + \llbracket h_g \rrbracket \\ h_f \perp h_k \perp h_g \\ Q \llbracket V \rrbracket h_f \end{array} \right.$$

**Completeness theorem:** (slightly simplified)

$$\left\{ \begin{array}{l} \vdash t : T \\ t / m \Downarrow v / m' \end{array} \right. \Rightarrow \llbracket t \rrbracket (\text{mgh } m) (\text{mgp } v m')$$

**Completeness, special case:**

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

# Formalization in Coq

---

**For the language IMP (assign, while, skip, if, seq)**

(\* Axiomatization of source language \*)

Definition heap := nat -> nat.

Inductive command := ...

Inductive eval : command -> heap -> heap -> Prop := ..

(\* Construction of characteristic formulae \*)

Definition Hprop := heap -> Prop.

Definition Formula := Hprop -> Hprop -> Prop.

Fixpoint cf (c : command) : Formula := ...

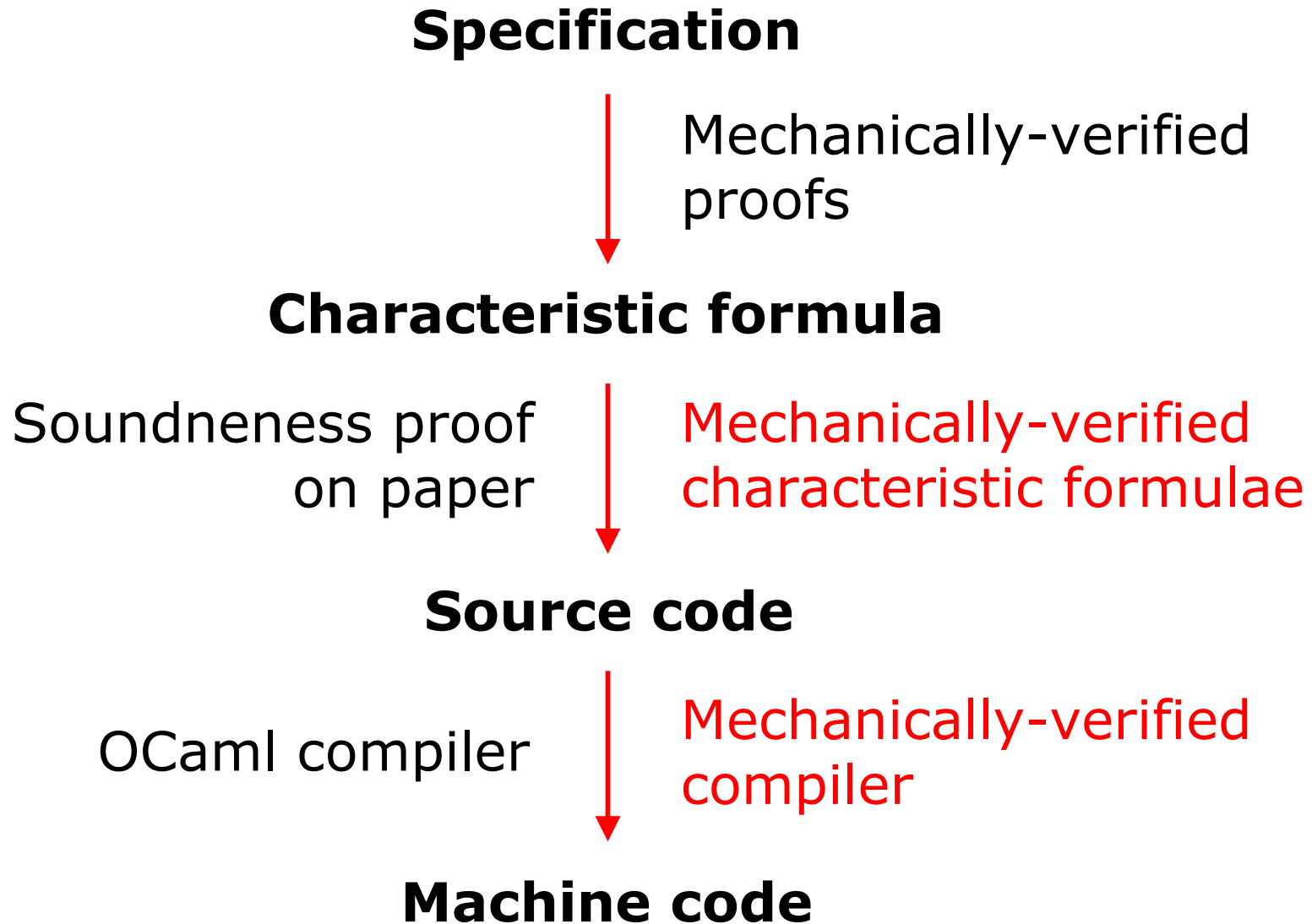
(\* Soundness and completeness results \*)

Theorem cf\_sound :  $\forall (c:\text{command}) (P Q:\text{Hprop}) (h:\text{heap}),$   
 $\text{cf } c P Q \rightarrow P h \rightarrow \exists h', \text{eval } c h h' \wedge Q h'.$

Theorem cf\_complete :  $\forall (c:\text{command}) (h h':\text{state}),$   
 $\text{eval } c h h' \rightarrow \text{cf } c (= h) (= h').$

# Towards a fully-verified chain

---



# Thanks!

Further information on characteristic formulae:

*Characteristic Formulae for Mechanized Program Verification*

Arthur Charguéraud, September 2010

<http://arthur.chargueraud.org/research/2010/thesis>