# On Reasoning about Recursive Programs using Structural Induction* 

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#### Abstract

This note was written at the occasion of the retirement of Professor JeanFrançois Perrot at the Université Pierre et Marie Curie (Paris VI). In an attempt to emulate his academic spirit, we revisit an example proposed by Patrick Greussay in his doctoral thesis: how to verify in sublinear time whether a Calder mobile is well balanced. Rather than divining one solution or another, we derive a spectrum of solutions, starting from the original specification of the problem. We also prove their correctness using structural induction.


Keywords: Calder mobiles. Continuations. Functional programming. Structural induction.

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[^0]
## 1 Introduction

The original goal of this note was to revisit an example due to Patrick Greussay [7, pages 66-68]: how to determine, in sub-linear time, whether a mobile is balanced.

## Prerequisites

We assume from the reader some familiarity with functional programming in general and the ML programming language in particular [8]. In addition, we reason over ML terms equationally to establish their observational equivalence $($ noted $\cong)$.

## 2 Calder Mobiles

Definition 1 (Calder mobile) A mobile is inductively defined as an object of some weight or a bar of some weight with two sub-mobiles.

Definition 2 (representing a mobile in ML) The following data type specifies the representation of a mobile:

```
datatype mobile = OBJ of int
    | BAR of int * mobile * mobile
```

For example, let us note m 1 and m 2 the two following mobiles:

```
val m1 = BAR (1,
    BAR (1, OBJ 2, OBJ 2),
    OBJ 5)
val m2 = BAR (1,
    OBJ 6,
    BAR (1, OBJ 2, OBJ 9))
```

Definition 3 (structural induction over mobiles) Given a predicate $M$, if

1. for any value n : int, $M(\mathrm{OBJ} \mathrm{n})$ holds, et
2. for all values n : int, and $\mathrm{m} 1, \mathrm{~m} 2$ : mobile, if $M(\mathrm{~m} 1)$ and $M(\mathrm{~m} 2)$ hold then $M(\mathrm{BAR}(\mathrm{n}, \mathrm{m} 1, \mathrm{~m} 2))$ holds,
then for any value m : mobile, $M(\mathrm{~m})$ holds.
Definition 4 (weight of a mobile) The weight of a mobile is the sum of the weight of its objects and of its bars.

For example, the weight of the mobile denoted by $m 1$ is 11 , and the weight of the mobile denoted by m2 is 19 .

Proposition 1 The following recursive function computes the weight of a mobile:

```
(* weight : mobile -> int *)
fun weight m
    = let (* visit : mobile -> int *)
        fun visit (OBJ n)
            = n
            | visit (BAR (n, m1, m2))
                = n + (visit m1) + (visit m2)
    in visit m
    end
```

Proof: By stri

```
datatype 'a option = SOME of 'a
    | NONE
```

We also use two auxiliary functions to lift a unary function and a binary function:

```
(* lift1 : ('a -> 'b option)
    -> 'a option -> 'b option *)
fun lift1 f
    =(fn (SOME v)
            => f v
            | _
            => NONE)
(* lift2 : ('a * 'b -> 'c option)
    -> 'a option * 'b option -> 'c option *)
fun lift2 f
    = (fn (SOME v1, SOME v2)
            => f (v1, v2)
            | _
                    => NONE)
```

Proposition 3 The following function computes whether a mobile is balanced:

```
(* equil1 : mobile -> bool *)
fun equil1 m
    = let (* visit : mobile -> int option *)
            fun visit (OBJ n)
                    = SOME n
                    | visit (BAR (n, m1, m2))
                    = lift2 (fn (n1, n2) => if n1 = n2
                                    then SOME (n + n1 + n2)
                                    else NONE)
                (visit m1, visit m2)
        in case visit m
            of (SOME _)
                => true
            | NONE
                => false
        end
```

(Readers uncomfortable with lift2 can mentally unfold its call.)
Proof: By structural induction, using the following predicate:
$M(\mathrm{~m}) \equiv$ equil1.visit $\mathrm{m} \cong \begin{cases}\text { SOME } \mathrm{n} & \text { if the mobile denoted by } \mathrm{m} \text { is balanced } \\ \text { NONE } & \text { otherwise }\end{cases}$

This solution is linear since the mobile is traversed once. However, it is completely traversed, even when one of its sub-mobiles (and therefore the entire
mobile) is ill-balanced. We therefore break the symmetry of the solution so that the second sub-mobile of a bar is only traversed if the first is balanced:

Proposition 4 The following function computes whether a mobile is balanced:

```
(* equil2 : mobile \(->\) bool *)
fun equil2 m
    = let (* visit : mobile -> int option *)
        fun visit (OBJ n)
            \(=\) SOME n
            | visit (BAR (n, m1, m2))
            \(=\) lift1 (fn n1
                => lift1 (fn n2
                                    => if \(\mathrm{n} 1=\mathrm{n} 2\)
                                    then SOME ( \(\mathrm{n}+\mathrm{n} 1+\mathrm{n} 2\) )
                                    else NONE)
                                    (visit m2))
                                    (visit m1)
        in case visit m
            of (SOME _)
                \(\Rightarrow\) true
            | NONE
                => false
        end
```

Proof: By structural induction, using the same predicate as in Proposition 3.

This solution is sub-linear because the rest of the mobile is not traversed if one of its sub-mobiles is ill-balanced. However, in this case, the computation yields NONE and degenerates into a cascade of returns and of tests verifying whether none has been returned.

One can use an exception to short-cut this cascade:

```
(* equil3 : mobile -> bool *)
fun equil3 m
    = let exception STOP
        (* visit : mobile -> int *)
        fun visit (OBJ n)
            = n
            | visit (BAR (n, m1, m2))
            = let val n1 = visit m1
                    val n2 = visit m2
            in if n1 = n2
                then n + n1 + n2
                else raise STOP
            end
        in let val _ = visit m
        in true
        end handle STOP => false
    end
```

Instead of mobile -> int option, the type of equil3.visit is now mobile -> int, but this function is no longer pure because of the exception. Does this mean that a purely functional solution is out of reach? The answer is of course negative if one uses an exception monad [9], and doubly so if one passes intermediate results to a continuation, which we proceed to do.

Getting back to equil2, one can see that there are three calls to visit, each in a context. Let us represent this context as a unary function (the continuation) and let us pass this function to visit:
Proposition 5 The following function computes whether a mobile is balanced:

```
(* equil4 : mobile \(\rightarrow\) bool *)
fun equil4 m
    \(=\) let \((*\) visit \(:\) mobile \(*\) (int option \(->\) bool) \(->\) bool *)
        fun visit (OBJ n, k)
            = k (SOME n )
                | visit (BAR ( \(\mathrm{n}, \mathrm{m} 1, \mathrm{~m} 2\) ), k)
                    \(=\) visit (m1,
                        fn (SOME n1)
                            => visit (m2,
                                    fn (SOME n2)
                                    \(\Rightarrow\) if \(\mathrm{n} 1=\mathrm{n} 2\)
                                    then \(k\) (SOME ( \(n+n 1+n 2)\) )
                                    else k NONE
                                    1 -
                                    \(\Rightarrow k\) NONE)
                            1 -
                            "> k NONE)
        in visit (m, fn (SOME _)
                            => true
                            | NONE
                            => false)
    end
```

In equil2, the type of visit was mobile $->$ int option and the type of equil2 was mobile $->$ bool. In equil4, the type of visit is mobile $*$ (int option $->$ bool) -> bool and the type of equil4 is mobile $->$ bool, i.e., the co-domain of equil4.visit and of its continuation is the co-domain of equil4.
Proof: We show that for any value m : mobile, evaluating equil2 m yields a Boolean value $b$ if and only if evaluating equil 4 m yields the same Boolean value b. We proceed by structural induction using the following predicate:

$$
\begin{aligned}
M(\mathrm{~m}) \equiv & \text { for all values } \mathrm{k}: \text { int option }->\text { bool } \\
& \text { equil2.visit } \mathrm{m} \cong \mathrm{v} \Leftrightarrow \text { equil4.visit }(\mathrm{m}, \mathrm{k}) \cong \mathrm{k} \mathrm{v} \\
& \text { for some } \mathrm{v}: \text { int option }
\end{aligned}
$$

Continuation-passing has not solved the problem-once the continuation is applied to NONE, the same test cascade occurs. Fortunately, we can use the type isomorphism

```
int option -> bool \cong (int -> bool) * (unit -> bool)
```

and split the continuation into two: one is applied if the current sub-mobile is balanced and the other is used otherwise:

```
(* equil5 : mobile -> bool *)
fun equil5 m
    = let (* visit : mobile * (int -> bool) * (unit -> bool)
        -> bool *)
        fun visit (OBJ n, ki, ku)
                = ki n
                | visit (BAR (n, m1, m2), ki, ku)
                = visit (m1,
                fn n1
                                    => visit (m2,
                                    fn n2
                                    #> if n1 = n2
                                    then ki (n + n1 + n2)
                                    else ku (),
                                    ku),
                ku)
    in visit (m, fn _ => true, fn () => false)
    end
```

In the recursive call to visit, we write ku instead of fn () => ku () (i.e., we $\eta$-reduce ku) to short-cut the cascade of returns in case of ill balance. This definition coincides with Patrick Greussay's solution [7, page 67].

Additionally, instead of schlepping ku across the recursive calls to visit, we can "lambda-drop" it [6] from its declaration site (the initial call to visit) to its use site (the alternative branch of the equality test) and $\beta$-reduce (fn () => false) ():

```
(* equil6 : mobile -> bool *)
fun equil6 m
    = let (* visit : mobile * (int -> bool) -> bool *)
        fun visit (OBJ n, k)
            = k n
            | visit (BAR (n, m1, m2), k)
            = visit (m1,
                fn n1
                => visit (m2,
                        fn n2
                                    => if n1 = n2
                                    then k (n + n1 + n2)
                                    else false))
        in visit (m, fn _ => true)
        end
```

(Alternatively, we could have used the type isomorphism between unit -> bool and bool and replaced $f n$ () => false by false, which only works here because false is a value.)

We can now write this solution in direct style with callcc and throw [3] (found in the SMLofNJ. Cont library of Standard ML of New Jersey): callcc captures the current continuation and throw restores a captured continuation.

```
(* equil7 : mobile -> bool *)
fun equil7 m
    = callcc (fn k => let (* visit : mobile -> bool *)
                                fun visit (OBJ n)
                    = n
                        | visit (BAR (n, m1, m2))
                            = let val n1 = visit m1
                            val n2 = visit m2
                in if n1 = n2
                    then n + n1 + n2
                    else throw k false
                end
        in let val _ = visit m
        in true
        end
    end)
```

The initial continuation of equil7 is captured; it is only activated, during the computation, if the mobile is ill-balanced.

We can also defunctionalize this solution into a transition system, i.e., an abstract machine or again a pushdown automaton $[4,5,10,12]$. To this end, we identify that an inhabitant of the function space int $->$ bool is an instance of three lambda-abstractions in the definition of equil6 (this identification is the result of a control-flow analysis). We thus represent this function space by a sum (i.e., in ML, by a data type cont), each lambda-abstraction by the corresponding constructor in cont, and each application by a call to a function apply_cont that interprets the constructor:

Proposition 6 The following function computes whether a mobile is balanced:

```
(* equil8 : mobile -> bool *)
fun equil8 m
    = let datatype cont = C0
            | C1 of int * mobile * cont
            | C2 of int * int * cont
                (* apply_cont : cont * int -> bool *)
                fun apply_cont (CO, _)
            = true
            | apply_cont (C1 (n, m2, c), n1)
            = visit (m2, C2 (n, n1, c))
```

```
        | apply_cont (C2 (n, n1, c), n2)
    = if n1 = n2
        then apply_cont (c, n + n1 + n2)
        else false
    (* visit : mobile * cont -> bool *)
    and visit (OBJ n, c)
    = apply_cont (c, n)
    | visit (BAR (n, m1, m2), c)
        = visit (m1, C1 (n, m2, c))
    in visit (m, CO)
    end
```

Proof: We show that for any value $m$ : mobile, evaluating equil m yields a Boolean value b if and only if evaluating equil8 m yields the same Boolean value b. We proceed by structural induction using the logical relation

$$
\begin{aligned}
K(\mathrm{k}, \mathrm{c}) \equiv & \text { for any value } \mathrm{n}: \text { int } \\
& \mathrm{k} \mathrm{n} \cong \mathrm{~b} \Leftrightarrow \text { equil8.apply_cont }(\mathrm{c}, \mathrm{n}) \cong \mathrm{b} \\
& \text { for some value } \mathrm{b}: \text { bool }
\end{aligned}
$$

and the following predicate:

$$
\begin{aligned}
M(\mathrm{~m}) \equiv & \text { for all the values } \mathrm{k}: \text { int } \rightarrow \text { bool and } \mathrm{c}: \text { cont satisfying } K(\mathrm{k}, \mathrm{c}) \\
& \text { equil6.visit }(\mathrm{m}, \mathrm{k}) \cong \mathrm{k} \mathrm{n} \Leftrightarrow \\
& \text { equil8.visit }(\mathrm{m}, \mathrm{c}) \cong \text { equil8.apply_cont }(\mathrm{c}, \mathrm{n}) \\
& \text { for some value } \mathrm{n}: \text { int } \\
& \text { or } \\
& \text { equil6.visit }(\mathrm{m}, \mathrm{k}) \cong \text { false } \Leftrightarrow \text { equil8.visit }(\mathrm{m}, \mathrm{c}) \cong \text { false }
\end{aligned}
$$

Here is a representative case of the proof, to show that for all the values n : int, m 1 : mobile, m2 : mobile, k : int $->$ bool and c : cont satisfying $M(\mathrm{~m} 1), M(\mathrm{~m} 2)$ and $K(\mathrm{k}, \mathrm{c})$,

```
equil6.visit (BAR (n, m1, m2), k)\cong k n' }
equil8.visit (BAR ( }n,m1,m2\mathrm{ ), c) § equil8.apply_cont (c, n')
for some value n' : int
or
equil6.visit (BAR (n, m1, m2), k)\cong false
#
equil8.visit (BAR (n, m1, m2), c)\cong false
```

By definition, equil6.visit (BAR ( $n, m 1, m 2$ ), $k$ ) $\cong$ equil6.visit ( $m 1$, fn n 1 => ...). Since $K(\mathrm{k}, \mathrm{c})$ holds, we simply verify that for any value n 1 : int, the relation

$$
K(\mathrm{fn} \mathrm{n} 2 \Rightarrow \text { if } \mathrm{n} 1=\mathrm{n} 2 \text { then } \mathrm{k}(\mathrm{n}+\mathrm{n} 1+\mathrm{n} 2) \text { else false, } \mathrm{C} 2(\mathrm{n}, \mathrm{n} 1, \mathrm{c}))
$$

also holds. By induction hypothesis on $m 2$, for any value $n 1$ : int,

```
equil6.visit (m2, fn n2 => ...) \cong(fn n2 => ...) n2
=>
equil8.visit (m2, C2 (n, n1, c)) \cong equil8.apply_cont (C2 (n, n1, c), n2)
for some value n2 : int
or
equil6.visit (m2, fn n2 => ...) \cong false
=>
equil8.visit (m2, C2 (n, n1, c)) \cong false
```

We can thus verify that the relation

```
K(fn n1 => equil6.visit (m2, fn n2 => ...), C1 (n, m2, c))
```

holds, which puts us in position to apply the induction hypothesis on m1.
Alternatively to the data type cont, we can defunctionalize the continuation into a stack of frames and interpret it with a popping function:

```
(* equil9 : mobile -> bool *)
fun equil9 m
    = let datatype frame = F1 of int * mobile
        | F2 of int * int
        type cont = frame list
        (* pop_frame : cont * int -> bool *)
        fun pop_frame (nil, _)
            = true
            | pop_frame ((F1 (n, m2)) :: c, n1)
            = visit (m2, (F2 (n, n1)) :: c)
            | pop_frame ((F2 (n, n1)) :: c, n2)
            = if n1 = n2
                then pop_frame (c, n + n1 + n2)
                else false
        (* visit : mobile * cont -> bool *)
        and visit (OBJ n, c)
            = pop_frame (c, n)
            | visit (BAR (n, m1, m2), c)
                = visit (m1, (F1 (n, m2)) :: c)
        in visit (m, nil)
        end
```


## 4 Analysis

The reader is now equipped to tackle the traditional multiplication example of integers in a tree, exploiting the absorption property of 0 and deriving a spectrum of solutions ${ }^{1}$ rather than heroically inventing one of these solutions.

[^1]More generally, the derivation presented here illustrates a class of applications of continuations (and of exceptions) for functions of type $t_{1} \rightarrow t_{2}$ that use an auxiliary function of type $t_{3} \rightarrow t_{4}+t_{5}$. Often, one can:

1. CPS-transform the auxiliary function [2], giving it the following type:

$$
t_{3} \times\left(t_{4}+t_{5} \rightarrow t_{2}\right) \rightarrow t_{2}
$$

2. split the continuation into two:

$$
t_{3} \times\left(t_{4} \rightarrow t_{2}\right) \times\left(t_{5} \rightarrow t_{2}\right) \rightarrow t_{2}
$$

and
3. simplify one of the two continuations and its use (e.g., when $t_{5}$ is the unit type, as for Calder mobiles, for multiplying integers in the leaves of a tree, or for programming an substitution algorithm that preserves sharing).

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[^0]:    *English translation of "Sur un exemple de Patrick Greussay" [1].
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[^1]:    ${ }^{1}$ Namely with a local function whose co-domain is int option, or that uses an exception, or a continuation, or a stack of sub-trees.

