From Data-Oriented Designs to Algorithms and Back

José Pedro Correia João Saraiva José Nuno Oliveira

Departamento de Informática Universidade do Minho

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Overview

Motivation From data-structures to algorithms and back Recursion removal Future work

Motivation

Prom data-structures to algorithms and back

- Case study
- From data-structures to algorithms
- From algorithms to data-structures
- Generalizations

3 Recursion removal

- Case study
- Introduction of a stack by calculation
- Introduction of a stack by "intuition"
- Discussion

Future work

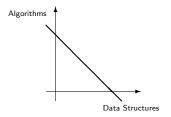
Programs = Algorithms + Data Structures

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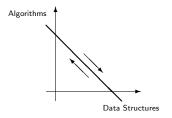
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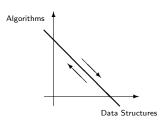
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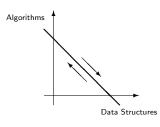


Conversions

From data-structure oriented designs to algorithmic oriented designs

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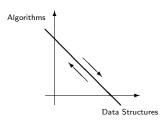


Conversions

 From data-structure oriented designs to algorithmic oriented designs ≡ Specialization

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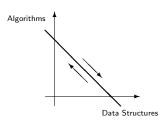
Programs = Algorithms + Data Structures



Conversions

- From data-structure oriented designs to algorithmic oriented designs ≡ Specialization
- From algorithmic oriented designs to data-structure dependant designs

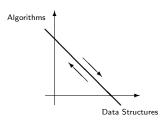
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Conversions

- From data-structure oriented designs to algorithmic oriented designs ≡ Specialization
- Prom algorithmic oriented designs to data-structure dependant designs ≡ Generalization

Programs = Algorithms + Data Structures



Conversions

- From data-structure oriented designs to algorithmic oriented designs ≡ Specialization
- Prom algorithmic oriented designs to data-structure dependant designs ≡ Generalization

Case study

• LL(1) language recognition

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LL(1) language recognition

 Let us define a language using a context free grammar (CFG) like the following:



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LL(1) language recognition

 Let us define a language using a context free grammar (CFG) like the following:



• From this, one can conceive a function to test if a given string belongs to the language in two common fashions:

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LL(1) language recognition

A representation of a transition table ("large" data-structure) and a function to consult it ("small" algorithm):

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LL(1) language recognition

A representation of a transition table ("large" data-structure) and a function to consult it ("small" algorithm):

Transition table						
		а	Ь	t	d	
	S	error	error	error	dAd	
	Α	аA	BA	BA	ε	
	В	error	bB	t	error	
			•	•	•	

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LL(1) language recognition

Fnal program (where tt refers to the transition table):

Table driven recognizer

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LL(1) language recognition Recursive descendant

A set of mutually recursive functions ("large" algorithm):

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LL(1) language recognition Recursive descendant

A set of mutually recursive functions ("large" algorithm):

Recursive descendant recognizer

```
accept inp = let (v,ri) = recognize_S inp in if (null ri) then v else False
recognize_S inp@('d':ri) =
    let (v1,ri1) = recognize_A ri1
        (v2,ri2) = recognize_A ri1
        (v3,ri3) = recognize_A ri2
        in if (v1 && v2) then (v3,ri3) else (False,inp)
recognize_S inp = (False,inp)
recognize_A inp@('a':ri) =
    let (v1,ri1) = recognize_A inp
        (v2,ri2) = recognize_A ri1
        in if v1 then (v2,ri2) else (False,inp)
recognize_A inp@('b':ri) =
    let (v1,ri1) = recognize_B inp
        (v2,ri2) = recognize_A ri1
        in if v1 then (v2,ri2) else (False,inp)
```

Continues...

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LL(1) language recognition Recursive descendant

Recursive descendant recognizer

```
recognize_A inp@('t':ri) =
    let (v1,ri1) = recognize_B inp
        (v2,ri2) = recognize_A ri1
        in if v1 then (v2,ri2) else (False,inp)
recognize_A inp@('d':ri) = recognize_ inp
recognize_B inp@('b':ri) =
    let (v1,ri1) = recognize_b inp
        (v2,ri2) = recognize_B ri1
        in if v1 then (v2,ri2) else (False,inp)
recognize_B inp@('t':ri) = recognize_t inp
    recognize_B inp = (False,inp)
recognize_B inp = (True,inp)
```

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How to specialize a table driven parser?

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How to specialize a table driven parser?

One can calculate *a* recursive descendant recognizer from a table driven recognizer, by the application of:

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How to specialize a table driven parser?

One can calculate *a* recursive descendant recognizer from a table driven recognizer, by the application of:

Partial evaluation

What Specialization of a program (function) with respect to a static (known) input

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How to specialize a table driven parser?

One can calculate *a* recursive descendant recognizer from a table driven recognizer, by the application of:

Partial evaluation

What Specialization of a program (function) with respect to a static (known) input

Result Set of functions specialized for every possible static input generated by the initial call

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Partial evaluation

Let's take a look at a simple example:

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Partial evaluation

Let's take a look at a simple example:

Example

The following function:

```
power 0 x = 1
power x n = x * power (n-1) x
```

partially evaluated for the call power 3 x yields:

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Partial evaluation

Let's take a look at a simple example:

Example

The following function:

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power x n = x * power (n-1) x
```

partially evaluated for the call power 3 x yields:

```
power_3 x = x * power_2 x
```

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Partial evaluation

Let's take a look at a simple example:

Example

```
The following function:
```

```
power 0 x = 1
power x n = x * power (n-1) x
```

partially evaluated for the call power 3 x yields:

 $power_3 x = x * power_2 x$

```
power_2 x = x * power_1 x
```

```
power_1 x = x * power_0 x
```

 $power_0 = 1$

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How to specialize a table driven parser? Application of partial evaluation

Returning to our case study, let's recall our table driven recognizer...

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LL(1) language recognition

Fnal program (where tt refers to the transition table):

Table driven recognizer

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How to specialize a table driven parser? Application of partial evaluation

• For LL(1) language recognition one can partially evaluate the auxiliary function on dss and on the initial state of the stack

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How to specialize a table driven parser? Application of partial evaluation

• For LL(1) language recognition one can partially evaluate the auxiliary function on dss and on the initial state of the stack

Calculated recursive descendant

```
accept inp = aux_dss_S inp
aux_dss_S ('d':ri) = aux_dss_Ad ri
aux_dss_S _ = False
aux_dss_Ad ('a':ri) = aux_dss_Ad ri
aux_dss_Ad ('b':ri) = aux_dss_BAd ri
aux_dss_Ad ('d':ri) = aux_dss_Ad ri
aux_dss_Ad ('d':ri) = aux_dss_ri
aux_dss_BAd ('b':ri) = aux_dss_BAd ri
aux_dss_BAd ('b':ri) = aux_dss_Ad ri
aux_dss_BAd ('t':ri) = aux_dss_Ad ri
aux_dss_BAd _ = False
aux_dss_I = True
aux_dss__ = False
```

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How to specialize a table driven parser? Application of partial evaluation

We've calculated a recognizer that:

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How to specialize a table driven parser? Application of partial evaluation

We've calculated a recognizer that:

• Does not use auxiliary data-structures

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How to specialize a table driven parser? Application of partial evaluation

We've calculated a recognizer that:

- Does not use auxiliary data-structures
- It's tail recursive (very efficient)

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How to specialize a table driven parser? Application of partial evaluation

We've calculated a recognizer that:

- Does not use auxiliary data-structures
- It's tail recursive (very efficient)

But it's not quite like the one built "directly" from the grammar...

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How to go back? Building a table

One can build a table to capture the behaviour of the calculated recursive descendant using the following approach:

• Each row represents a function

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- Each table entry in position (i, j) is the behaviour of function *i* for input *j*. This can be either:

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 - A constant value

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One can build a table to capture the behaviour of the calculated recursive descendant using the following approach:

- Each row represents a function
- Each column represents a possible input
- Each table entry in position (i, j) is the behaviour of function *i* for input *j*. This can be either:
 - A constant value
 - A pair of a recursive reference and a non-recursive pre-processing of the input

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How to go back? Building a table

This technique applied to our case study yields the following:

Table						
		('a':xs)	('b':xs)	('t':xs)	('d':xs)	[] []
	f_0 (aux_dss_S)	False	False	False	$(f_1, tail)$	False
	f_1 (aux_dss_Ad)	(<i>f</i> 1,tail)	(f ₂ ,tail)	(<i>f</i> 1,tail)	(f ₃ ,tail)	False
	f_2 (aux_dss_BAd)	False	(f ₂ ,tail)	$(f_1, tail)$	False	False
	f_3 (aux_dss_)	False	False	False	False	True

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How to go back?

Given a representation of the former table as a function (named tt) we can write our acceptance function as:

Final program

```
accept inp = Just (f (tt,"f0") inp)
f (ft,k) d = aux (ft (k,d)) d
where aux (Left c) d = c
aux (Right (kr,h)) d = f (ft,kr) (h d)
```

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How to go back?

We have

- "Extracted" a table from the recursive structure of the functions
- Obtained, thus, a table driven recognizer

But

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How to go back?

We have

- "Extracted" a table from the recursive structure of the functions
- Obtained, thus, a table driven recognizer

But

- It's not quite like the one built "directly" from the grammar
- The function to manipulate the table is introduced *ad hoc*, as we know the desired type of the table
- The table contains functions that depend on the input, so it is not completely static

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Definitions

"Inspired" by the design of the LL(1) table driven recognizer, let us define a data-oriented design as follows:

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Definitions

"Inspired" by the design of the LL(1) table driven recognizer, let us define a data-oriented design as follows:

Data-oriented design

Definition A data-oriented design (DOD) is a tuple $(ds: T, p: D \rightarrow O, f: T \rightarrow D \rightarrow R)$, where: • ds is a statically known data-structure of type T• p is the top-level function of the program that takes a dynamical input of type D• p is expressed as $p = k \cdot f(ds)$ • f is the function that "deals" with values of type T

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Definitions

"Inspired" by the design of the LL(1) recursive descendant recognizer, let us define a algorithmic-oriented design as follows:

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Definitions

"Inspired" by the design of the LL(1) recursive descendant recognizer, let us define a algorithmic-oriented design as follows:

Algorithmic-oriented design

Definition An algorithmic-oriented design (AOD) is a tuple $(p: D \rightarrow O, fs: (D \rightarrow R)^*)$

• *p* is the top-level function of the program that takes a dynamical input of type *D*

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- fs is a set of mutually recursive functions
- given $f_0 \in fs$, p is expressed as $p = k \cdot f_0$

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DOD to AOD Is partial evaluation still applicable?

• Partial evaluation aims to, from $f : S \to D \to O$ and a call $f(s_1)$, obtain a function $f_{s_1} : D \to O$ such that:

$$f_{s_1}(d) = f(s_1)(d)$$

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• Partial evaluation aims to, from $f : S \to D \to O$ and a call $f(s_1)$, obtain a function $f_{s_1} : D \to O$ such that:

$$f_{s_1}(d) = f(s_1)(d) \equiv f_{s_1} = f(s_1)$$

• From our definition of a DOD, $p = k \cdot f(ds)$ can then be partially evaluated yielding $p = k \cdot f_{ds}$

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DOD to AOD Is partial evaluation still applicable?

• Partial evaluation aims to, from $f : S \to D \to O$ and a call $f(s_1)$, obtain a function $f_{s_1} : D \to O$ such that:

$$f_{s_1}(d) = f(s_1)(d) \equiv f_{s_1} = f(s_1)$$

- From our definition of a DOD, $p = k \cdot f(ds)$ can then be partially evaluated yielding $p = k \cdot f_{ds}$
- Moreover, as we saw before, partially evaluation of $f_{ds}: D \rightarrow R$ produces a set of, also specialized functions, $f_*: (D \rightarrow R)^*$

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- Moreover, as we saw before, partially evaluation of $f_{ds}: D \rightarrow R$ produces a set of, also specialized functions, $f_*: (D \rightarrow R)^*$
- Thus we have an AOD where $f_0 = f_{ds}$ and $fs = f_*$

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AOD to DOD Building a table

Generalizing the strategy used for LL(1) recognition, one can build a table to capture the relations between the functions in $fs: (D \rightarrow R)^*$ using the following criteria:

• Each function $f_i \in f_s$ yields a row identified by $iden(f_i)^{-1}$

¹where *iden* : $(D \rightarrow R) \rightarrow I$

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- Each table entry in position (*iden*(*f_i*), *d_j*) represents the behaviour of function *f_i* for input *d_j* by a sequence of references, wich are either:
 - A function $g: D \rightarrow R$ where $g \notin fs$

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 - A value $k \in I$ for calls to $f_k \in f_s$ such that $k = iden(f_k)$

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After building the table that captures the relations in fs (let's name it tt), we now need a function to "work" with it:

Auxiliary function

```
f (ft,k) d = (composeAll . map aux) (ft (k,d)) $ d
where aux (Left g) = g
        aux (Right (Left h)) = h
        aux (Right (Right k1)) = f (ft,k1)
        composeAll = foldr1 (.)
```

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We then just define $p = k \cdot f(tt, iden(f_0))$ and we have a DOD that corresponds to the initial AOD

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We then just define $p = k \cdot f(tt, iden(f_0))$ and we have a DOD that corresponds to the initial AOD (no proof yet!)

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We have a strategy for conversion, but:

- It's based on intuition by generalizing the LL(1) strategy
- It imposes restrictions on the covered AOD's, namely:

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- It's based on intuition by generalizing the LL(1) strategy
- It imposes restrictions on the covered AOD's, namely:
 - Control flow has to rely only in pattern matchings
 - Every function $f_i \in fs$ should be entire
 - Calls must be sequential compositions of functions applied to the input
 - References to other functions from *fs* must be "direct"

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AOD to DOD

We have a strategy for conversion, but:

- It's based on intuition by generalizing the LL(1) strategy
- It imposes restrictions on the covered AOD's, namely:
 - Control flow has to rely only in pattern matchings
 - Every function $f_i \in fs$ should be entire
 - Calls must be sequential compositions of functions applied to the input
 - References to other functions from fs must be "direct"
- The table contains functions that depend on the input, so it is not completely static

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Postorder tree traversal

Let's consider the following Haskell datatype and a postorder traversal function over it:

Example

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Postorder tree traversal

Let's consider the following Haskell datatype and a postorder traversal function over it:

Example

How can we turn this function into a tail recursive equivalent by the introduction of an auxiliary data-structure?

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Adding continuations

• Continuations make the order of evaluation explicit

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Adding continuations

- Continuations make the order of evaluation explicit
- The objective is to obtain a definition
 postorder' :: T a -> Cont a -> [a] such that
 postorder' t c = c (postorder t) where type Cont a = [a] -> [a]

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Adding continuations

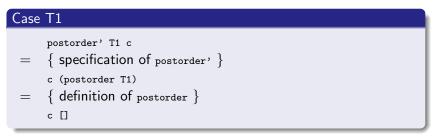
- Continuations make the order of evaluation explicit
- The objective is to obtain a definition
 postorder' :: T a -> Cont a -> [a] such that
 postorder' t c = c (postorder t) where type Cont a = [a] -> [a]
- This can be obtained by calculation

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Adding continuations

Let's calculate the definition of postorder, with continuations:



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Adding continuations

Case T2 a t1

postorder' (T2 a t1) c

- $= \{ \text{ specification of }_{postorder'} \}$
 - c (postorder (T2 a t1))
- $= \{ \text{ definition of postorder} \}$
 - c (postorder t1 ++ [a])
- = { abstraction over postorder t1 }
 - (\x -> c (x ++ [a])) (postorder t1)
- = { specification of postorder' }
 postorder' t1 (\x -> c (x ++ [a]))

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Adding continuations

Omitting the calculation for the case T3 a t1 t2 t3, one obtains:

Result

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Defunctionalizing

What we got

• Our function is already tail-recursive, due to the passing of extra recursive calls as continuations

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Defunctionalizing

What we got

- Our function is already tail-recursive, due to the passing of extra recursive calls as continuations
- Nevertheless, we would like to capture the continuations, not by functions but by a data-structure

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Defunctionalizing

What we got

- Our function is already tail-recursive, due to the passing of extra recursive calls as continuations
- Nevertheless, we would like to capture the continuations, not by functions but by a data-structure
- This can be done in three steps

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Defunctionalizing Collect the continuations

First we collect the different forms of continuations used

Continuations

```
c1 :: Cont a
c1 = \x -> x
c2 :: a -> Cont a -> Cont a
c2 a c = \y -> c (y ++ [a])
c3 :: a -> [a] -> [a] -> Cont a -> Cont a
c3 a x y c = \z -> c (x ++ y ++ z ++ [a])
c4 :: a -> [a] -> T a -> Cont a -> Cont a
c4 a x t3 c = \y -> postorder' t3 (c3 a x y c)
c5 :: a -> T a -> T a -> Cont a -> Cont a
c5 a t2 t3 c = \x -> postorder' t2 (c4 a x t3 c)
```

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Defunctionalizing Defining the datatype

Now we can define a datatype that represents all the continuations

Datatype

```
data CONT a =

C1

| C2 a (CONT a)

| C3 a [a] [a] (CONT a)

| C4 a [a] (T a) (CONT a)

| C5 a (T a) (T a) (CONT a)
```

and we can represent this, from another point of view, as

```
type CONT a = [INST a]
data INST a =
I1 a
| I2 a [a] [a]
| I3 a [a] (T a)
| I4 a (T a) (T a)
```

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Defunctionalizing Putting things together

In order to keep correspondence to the former representation of continuations, we need a function that applies our datatype to a result of type [a], wich results in our final version:

Final program

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Introduction of a stack by "intuition"

If we would try to write a postorder function with a stack to "manage" the recursive calls, one could produce something like the following:

Postorder with stack

```
postorder' :: T a -> [Either (a,T a) (a,T a,T a)] -> [a]
postorder' T1 [] = []
postorder' T1 ((Left (a,t3)):t) = postorder' t3 t ++ [a]
postorder' T1 ((Right (a,t2,t3)):t) = postorder' t2 ((Left (a,t3)):t)
postorder' (T2 a t1) t = postorder' t1 t ++ [a]
postorder' (T3 a t1 t2 t3) t = postorder' t1 ((Right (a,t2,t3)):t)
postorder t = postorder' t []
```

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Comparison

• The second is "partially evaluatable" to the original definition

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- The second is "partially evaluatable" to the original definition
- The first has two mutually recursive function

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Comparison

- The second is "partially evaluatable" to the original definition
- The first has two mutually recursive function
- The second is just one tail-recursive function

But

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Comparison

- The second is "partially evaluatable" to the original definition
- The first has two mutually recursive function
- The second is just one tail-recursive function

But

• The first is obtained by calculation

Future work

For the first section

- Address the problem of termination of partial evaluation
- $\bullet\,$ Supply a proof for the general strategy of conversion AOD $\rightarrow\,$ DOD

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Future work

For the first section

- Address the problem of termination of partial evaluation
- $\bullet\,$ Supply a proof for the general strategy of conversion AOD $\rightarrow\,$ DOD

For recursion removal

- Try to make a connection to the other subject
- Determine a relation between the calculation and the "intuition"
- Analyse the relation with *derivatives of containers*

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