

# Two Tricks for Program Optimization

## Difference lists and the Codensity monad

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# Overview

- 1 Who am I?
- 2 Shape of Things
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# Who am I?

## Places, things, and things

- 1 NY -> Paris -> NY -> Chicago -> NY -> Austin -> SF
- 2 Cinema Studies -> Math -> ML Data Scientist (@6sense)
- 3 Movies -> Cooking -> Dogs (standard poodles)

# Shape of Things to Come

## Tricks for program optimization

- 1 Replace  $\text{mon}(\text{oid}|\text{ad})$  with  $\text{mon}(\text{oid}|\text{ad})$  of functions
- 2 Replace recursive constructions with function composition/application
- 3  $\text{rep} :: m \rightarrow mm$   
 $\text{abs} :: mm \rightarrow m$
- 4  $\text{abs} . \text{rep} = \text{id}$
- 5  $\text{rep} (x * y) = (\text{rep } x) @ (\text{rep } y)$

# Reversing a list

Suppose we want to reverse a list

```
rev :: [a] -> [a]
```

```
rev [] = []
```

```
rev (x:xs) = rev xs ++ [x]
```

# Reversing a list

Suppose we want to reverse a list

```
rev :: [a] -> [a]
rev [] = []
rev (x:xs) = rev xs ++ [x]
```

The problem is

```
(++) :: [a] -> [a] -> [a]
(++) [] ys = ys
(++) (x:xs) ys = x : xs ++ ys
```

is  $O(\text{length of the first list})$

# Reversing a list: complexity

Telescoping work

```
rev [1..3]
= (rev [2,3]) ++ [1]
= ((rev [3]) ++ [2]) ++ [1]
= (((rev []) ++ [3]) ++ [2]) ++ [1]
= ([] ++ [3]) ++ [2] ++ [1] -- 0 steps
= [3] ++ [2] ++ [1] -- 1 step
= [3,2] ++ [1] -- 2 steps
= [3,2,1]
```

so reversing a list of length  $n$  takes

$$0 + 1 + 2 + \dots + n - 1 = \frac{(n-1)n}{2} \sim n^2$$

steps.

# Definition of difference list

Hughes' idea: make a new datatype and functions to map there and back

```
type EList a = [a] -> [a]
```

```
rep :: [a] -> EList a
```

```
rep xs = (xs ++)
```

```
abs :: EList a -> [a]
```

```
abs f = f []
```

which satisfy

```
abs . rep = id
```

```
rep (xs ++ ys) = rep xs . rep ys
```



# Fast reverse

Now, we can define

```
rev' :: [a] -> EList a
rev' [] = rep []
rev' (x:xs) = rev' xs . rep [x]
```

and

```
fastReverse :: [a] -> [a]
fastReverse = abs . rev'
```

so

```
fastReverse xs = rev' xs []
```

# List vs. Difference List

We replaced appending

```
rev :: [a] -> [a]
rev [] = []
rev (x:xs) = rev xs ++ [x]
```

with function composition

```
rev' :: [a] -> EList a
rev' [] = rep []
rev' (x:xs) = rev' xs . rep [x]
```

which is  $O(1)$ .

# Difference Lists: Why? How?

Why would anyone think to replace list appending with function composition?

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Why would anyone think to replace list appending with function composition? Both are monoids

```
instance Monoid [a] where
    mempty = []
    mappend = (++)
```

```
instance Monoid (EList a) where
    mempty = id
    mappend = (.)
```

# Difference Lists: Why? How?

Why would anyone think to replace list appending with function composition? Both are monoids

```
instance Monoid [a] where
    mempty = []
    mappend = (++)
```

```
instance Monoid (EList a) where
    mempty = id
    mappend = (.)
```

and

```
rep (xs ++ ys) = rep xs . rep ys
```

is a monoid homomorphism.

# Cayley's Theorem

## Theorem (Cayley)

*Every monoid is isomorphic to a submonoid of its monoid of endomorphisms.*

- 1 (Endomorphisms are just functions from a thing to itself)
- 2 Meaning: given a monoid  $m$ , the functions  $m \rightarrow m$  are also a monoid, and we can *monoid-embed*  $m$  into  $m \rightarrow m$ .
- 3 This is from 1854.

# Difference lists review

Not a novel solution, not the best solution, but has good ideas

- 1 Replace monoid with monoid of functions
- 2 Replace appending with function composition
- 3 `rep xs = mappend xs`  
`abs f = f mempty`
- 4 `abs . rep = id`
- 5 `rep (mappend x y) = mappend (rep x) (rep y)`

# A tree monad

Substitution makes a tree a monad

```
data Tree a = Leaf a | Node (Tree a) (Tree a)
```

```
subst :: Tree a -> (a -> Tree b) -> Tree b
```

```
subst (Leaf x) k = k x
```

```
subst (Node l r) k = Node (subst l k) (subst r k)
```

```
instance Monad Tree where
```

```
    return = Leaf
```

```
    (>>=) = subst
```



# Growing a tree

Helper functions to grow trees

```
sprout :: Int -> Int -> Tree Int
sprout n = \i -> Node (Leaf (n - 1 - i)) (Leaf (i+1))

fullTree :: Int -> Tree Int
fullTree 1 = Leaf 1
fullTree n = fullTree (n-1) >>= sprout n
```

# Zigzagging down a tree

A length- $n$  computation

```
zigzag :: Tree Int -> Int
zigzag = zig
  where
    zig (Leaf n) = n
    zig (Node l r) = zag l
    zag (Leaf n) = n
    zag (Node l r) = zig r

zigzag (fullTree 3)
= zigzag (Leaf 1 >>= sprout 2 >>= sprout 3)
```

which is  $O(n^2)$

# Codensity monad

The codensity monad in general

```
type CodT m a = forall z . (a -> m z) -> m z
```

```
instance Monad (CodT m) where
    return x = \c -> c x
    f >=> g = \c -> f (\x -> g x c)
```

and for us

```
type Coden a = CodT Tree a
```

# Codensity rep and abs

Getting there and back

```
rep :: Tree a -> Coden a  
rep t = (t >>=)
```

```
abs :: Coden a -> Tree a  
abs p = p return -- Remember: return = Leaf!
```

Clearly

```
abs . rep = id
```

# Codensity “type constructors”

We can make functions like our Tree type constructors

```
leaf :: a -> Coden a
```

```
leaf = return
```

```
node :: Coden a -> Coden a -> Coden a
```

```
node p q = \h -> Node (p h) (q h)
```

# Codensity homomorphism property

We can make functions like our Tree type constructors

```
leaf :: a -> Coden a
leaf = return
```

```
node :: Coden a -> Coden a -> Coden a
node p q = \h -> Node (p h) (q h)
```

and we get our homomorphism property

```
rep (Leaf i) = leaf i
rep (t >>= f) = rep t >>= (rep . f)
rep (Node l r) = node (rep l) (rep r)
```

# Growing a Coden

Helper functions to grow Codens

```
sproden :: Int -> Int -> Coden Int
sproden n = \i -> node (leaf (n - 1 - i)) (leaf (i + 1))

fullCoden :: Int -> Coden Int
fullCoden 1 = leaf 1
fullCoden n = fullCoden (n-1) >>= sproden n
```

# Codensity punchline

Now zigzagging is  $O(n)$

```
rep (fullTree n) = fullCoden n
abs (fullCoden n) = fullTree n
```

```
fullCoden 3
= \h -> Node (Node (h 2) (h 1)) (Node (h 0) (h 3))
```

```
zigzag (fullTree 3)
= zigzag (abs (fullCoden 3))
= zigzag (abs (\ h -> Node (Node (h 1)) (h 0)))
= zigzag (Node (Leaf 1) (h 3))
```



# Similarities

## Same trick

- 1 Replace  $\text{mon}(\text{oid}|\text{ad})$  with  $\text{mon}(\text{oid}|\text{ad})$  of functions
- 2 Replace recursive constructions with function composition/application
- 3  $\text{rep} :: m \rightarrow mm \text{ -- } (xs \text{ ++}) \text{ vs. } (t \gg=)$   
 $\text{abs} :: mm \rightarrow m \text{ -- } f [] \text{ vs. } f \text{ return}$
- 4  $\text{abs} . \text{rep} = \text{id}$
- 5  $\text{rep } (x * y) = (\text{rep } x) @ (\text{rep } y)$

# Differences

But what about

- ① `m -> m` vs. `forall z . (a -> m z) -> m z` ?
- ② monoid vs. monad ?

# Differences?

Wait a minute!

① why not just

```
forall z . m z -> m z ?
```

② how do we make “functions from a functor to itself” a functor?

③ is “a monad *really* just a monoid in the category of endofunctors”?

# So much more

We still have all this to do!

- 1 Categories, functors (polymorphic datatypes), and natural transformations (polymorphic functions)
- 2 Two categories: category of datatypes, category of functors
- 3 Of monoids and monads
- 4 Currying/uncurrying in the category of functors
- 5 Yoneda Lemma
- 6 Derive  $\forall z.(a \rightarrow mz) \rightarrow mz$  from these

# References

See here

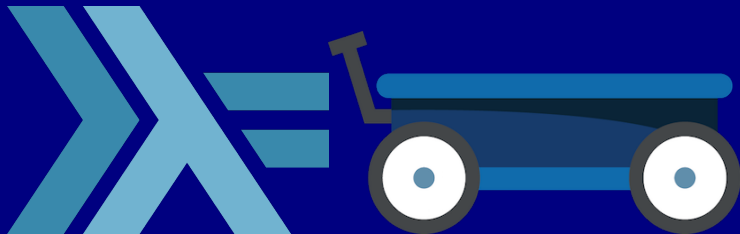
- 1 Rivas and Jaskelioff ▶ Notions of Computations as Monoids
- 2 Hughes ▶ A Novel Representation of Lists and its Application to the Function "Reverse"
- 3 Voigtlander ▶ Asymptotic Improvement of Computations over Free Monads
- 4 Hutton, Jaskelioff, and Gill ▶ Factorising Folds for Faster Functions
- 5 Hinze ▶ Kan Extensions for Program Optimisation Or: Art and Dan Explain an Old Trick

# Still good tricks!

Nonetheless, good stuff!

- 1 Replace  $\text{mon}(\text{oid}|\text{ad})$  with  $\text{mon}(\text{oid}|\text{ad})$  of functions
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- 3  $\text{rep} :: m \rightarrow mm$   
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Thanks!



Thanks!