## Functional Programming

Lecture 8: Reasoning and calculating

Twan van Laarhoven

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#### **Outline**

- Equational reasoning
- Proof by induction
- Program synthesis
- Fusion
- Summary

# Equational reasoning

#### Reasoning about programs

- Functional programs are just equations
  - equations as definitions, intended for evaluation
  - but also useful for reasoning: proofs
- Better than testing, because exhaustive
- No side-effects mean that rules of ordinary algebra apply:
  - Substitution of equals for equals
  - If x = y then y = x

### **Equational reasoning (I)**

```
Given
```

```
not :: Bool \rightarrow Bool
  not False = True
  not True = False
We can prove that: not (not False) = False
Proof:
  not (not False)
 = { definition of not (equation 1) }
  not True
 = { definition of not (equation 2) }
  False
```

### **Equational reasoning (II)**

```
Prove that: curry fst x y = const x y
Proof:
 curry fst x y
 = { definition of curry }
 fst(x,y)
 = { definition of fst }
 = { definition of const }
 const x y
```

# Where curry f a b = f (a,b) fst (a,b) = a const a b = a

## **Equational reasoning (III)**

```
Prove that: reverse [x] = [x]
Proof:
  reverse [x]
 = { list notation }
  reverse (x:[])
 = { definition of reverse (equation 2) }
  reverse [] ++ [x]
 = { definition of reverse (equation 1) }
  [] ++ [x]
 = \{ definition of ++ (equation 1) \}
  [x]
```

```
reverse :: [a] → [a]
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]

(++) :: [a] → [a] → [a]

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

# Proof by induction

#### **Programming and proving**

Programs over recursive types typically require recursion

```
explicit recursion (ad hoc)
```

```
\begin{array}{ll} \text{sum} & [] & = 0 \\ \text{sum} & (\text{x:xs}) = \text{x} + \text{sum xs} \end{array}
```

or "canned" recursion

$$sum = foldr (+) 0$$

uses predefined program schemes (higher-order functions)

#### **Programming and proving**

Proofs about recursive programs typically require induction

Every recursive datatype comes with a pattern of induction

• To prove: for any list xs, property P(xs) holds

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- Then the proof has two parts:
  - 1. Prove that P([]) holds (base case)

- To prove: for any list xs, property P(xs) holds
- Then the proof has two parts:
  - 1. Prove that P([]) holds (base case)
  - 2. Prove that P(x:xs) holds, given that P(xs) holds (induction step)

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- Part 2 uses the induction hypothesis: that P holds for xs

- To prove: for any list xs, property P(xs) holds
- Then the proof has two parts:
  - 1. Prove that P([]) holds (base case)
  - 2. Prove that P(x:xs) holds, given that P(xs) holds (induction step)
- Part 2 uses the *induction hypothesis*: that P holds for xs
- Induction is valid for the same reason that recursive programs are valid: every list is either [] or of the form (x:xs)

#### Recall definition

```
(++) :: [a] \rightarrow [a] \rightarrow [a]
[] ++ ys = ys
(x:xs) ++ ys = x : (xs ++ ys)
```

#### Monoid laws

- 1. [] ++ ys = ys
- 2. xs ++ [] = xs
- 3. (xs + ys) + zs = xs + (ys + zs)

Law 1: [] ++ ys = ys holds by definition of (++) (first equation)

```
(++) :: [a] \rightarrow [a] \rightarrow [a]
[] ++ ys = ys
(x:xs) ++ ys = x : (xs ++ ys)
```

To prove law 2: xs ++ [] = xsUse induction over xs

Case xs = [] (base case): [] ++ [] $= \{ definition of ++ \}$ 

Case xs = a: as (inductive step), with Induction Hypothesis: as ++ [] = [] (a:as) ++ [] $= \{ definition of ++ \}$ a:(as ++ []) $= \{ H \}$ a:as

```
(++) :: [a] \rightarrow [a] \rightarrow [a]

[] ++ ys = ys

(x:xs) ++ ys = x : (xs ++ ys)
```

```
To prove law 3: (xs + ys) + zs = xs + (ys + zs)
```

Three variables, which one to choose for applying induction? Heuristic: ++ does pattern matching on first argument. So do induction on xs.

Case xs = [] (base case):
 ([] ++ ys) ++ zs
 = { definition of ++ }
 ys ++ zs
 = { definition of ++ }
 [] ++ (ys ++ zs)

```
(++) :: [a] \rightarrow [a] \rightarrow [a]

[] ++ ys = ys

(x:xs) ++ ys = x : (xs ++ ys)
```

```
To prove law 3: (xs ++ ys) ++ zs = xs ++ (ys ++ zs)
```

Case xs = a:as (inductive step)
 Assuming IH: (as ++ ys) ++ zs = as ++ (ys ++ zs)
 ((a : as) ++ ys) ++ zs

```
(a : as) + (ys + zs)
```

```
(++) :: [a] \rightarrow [a] \rightarrow [a]

[] ++ ys = ys

(x:xs) ++ ys = x : (xs ++ ys)
```

```
To prove law 3: (xs + ys) + zs = xs + (ys + zs)
    Case xs = a:as (inductive step)
    Assuming IH: (as ++ ys) ++ zs = as ++ (ys ++ zs)
      ((a : as) ++ ys) ++ zs
      = \{ definition of +++ \}
      (a : (as ++ vs)) ++ zs
      = \{ definition of +++ \}
      a:((as ++ vs) ++ zs)
```

$$(a : as) ++ (ys ++ zs)$$

```
(++) :: [a] \rightarrow [a] \rightarrow [a]

[] ++ ys = ys

(x:xs) ++ ys = x : (xs ++ ys)
```

```
To prove law 3: (xs ++ ys) ++ zs = xs ++ (ys ++ zs)
    Case xs = a:as (inductive step)
    Assuming IH: (as ++ ys) ++ zs = as ++ (ys ++ zs)
      ((a : as) ++ ys) ++ zs
      = \{ definition of +++ \}
      (a : (as ++ vs)) ++ zs
      = \{ definition of ++ \}
      a:((as ++ vs) ++ zs)
      a: (as ++ (ys ++ zs))
      = \{ definition of ++ \}
      (a : as) ++ (ys ++ zs)
```

```
(++) :: [a] \rightarrow [a] \rightarrow [a]

[] ++ ys = ys

(x:xs) ++ ys = x : (xs ++ ys)
```

```
To prove law 3: (xs ++ ys) ++ zs = xs ++ (ys ++ zs)
    Case xs = a:as (inductive step)
    Assuming IH: (as ++ ys) ++ zs = as ++ (ys ++ zs)
      ((a : as) ++ ys) ++ zs
      = \{ definition of +++ \}
      (a : (as ++ vs)) ++ zs
      = \{ definition of ++ \}
      a:((as ++ ys) ++ zs)
      = \{ \mathsf{IH} \}
      a: (as ++ (ys ++ zs))
      = \{ definition of ++ \}
      (a : as) ++ (ys ++ zs)
```

#### **Example:** reverse-append

```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

Prove that for all xs, ys:

reverse (xs ++ ys) = reverse ys ++ reverse xs.

Proof by induction on xs

Case: xs = [] (base case):
 reverse ([] ++ ys)
 = { definition of ++ }
 reverse ys
 = { unitality ++ }
 reverse ys ++ []
 = { definition of reverse }
 reverse ys ++ reverse []

#### **Example:** reverse-append

```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

Case: xs = a:as (inductive step) using IH: reverse (as ++ ys) = reverse ys ++ reverse as reverse ((a:as) ++ ys) $= \{ definition of ++ \}$ reverse (a:(as ++ ys) = { definition of reverse } reverse (as ++ ys) ++ [a]  $= \{ \mathsf{IH} \}$ (reverse ys ++ reverse as) ++ [a] = { associativity of ++ } reverse ys ++ (reverse as ++ [a]) = { definition of reverse } reverse ys ++ reverse (a:as)

```
reverse [] = []

reverse (x:xs) = reverse xs ++ [x]

[] ++ ys = ys

(x:xs) ++ ys = x:(xs ++ ys)
```

Suppose we want to prove: reverse = id



```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

Suppose we want to prove: reverse . reverse = id
There is no variable to do induction on



```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

Suppose we want to prove: reverse  $\cdot$  reverse = id There is no variable to do induction on Add missing arguments

```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

Suppose we want to prove: reverse . reverse = id There is no variable to do induction on Add missing arguments
Hence we have to prove that (reverse . reverse) xs = id xs which is the same as reverse (reverse xs) = xs

```
reverse [] = []
reverse (x:xs) = reverse xs ++ [x]
      ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

```
Suppose we want to prove: reverse = id
There is no variable to do induction on
Add missing arguments
Hence we have to prove that (reverse . reverse) xs = id xs
which is the same as reverse (reverse xs) = xs
Proof by induction on xs
```

```
Case xs = [] (base case):
   reverse (reverse [])
  = { definition of reverse }
   reverse []
  = { definition of reverse }
```

Case xs = a: as (inductive step), Assuming IH: reverse (reverse as) = as reverse (reverse (a:as)) = { definition of reverse } reverse (reverse as ++ [a]) = { property reverse—append } reverse [a] ++ reverse (reverse as)  $= \{ IH \}$ reverse [a] ++ as = { property reverse—singleton } [a] ++ as = { list notation } (a:[]) ++ as $= \{ definition of ++ \}$ a: ([] ++ as) $= \{ definition of ++ \}$ a:as

```
reverse [] = []

reverse (x:xs) = reverse xs ++ [x]

[] ++ ys = ys

(x:xs) ++ ys = x:(xs ++ ys)
```

#### **Program synthesis**

```
reverse [] = []
reverse (x: xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

reverse is slow because ++ traverses its first argument. To eliminate ++ specify reverseCat xs ys = reverse xs ++ ys

Use induction to synthesize an efficient implementation of reverseCat

• Case xs = [] (base case):

```
reverseCat [] ys
= { specification of reverseCat }
reverse [] ++ ys
= { definition of reverse }
[] ++ ys
= { definition of ++ }
ys
```

#### **Program synthesis**

• Case xs = a:as (inductive step),

```
Assuming IH: for all lists es: reverseCat as es = reverse as ++ es
```

```
reverseCat (a:as) ys
= { specification of reverseCat }
reverse (a:as) ++ vs
= { definition of reverse }
(reverse as ++ [a]) ++ ys
= \{ associativity of ++ \}
reverse as ++ ([a] ++ vs)
= \{  list notation, definition of ++ \}
reverse as ++ (a:vs)
= { IH (right—to—left substituting a:ys for es) }
reverseCat as (a:ys)
```

```
reverse [] = []
reverse (x: xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

## **Program synthesis**

```
reverse [] = []
reverse (x: xs) = reverse xs ++ [x]
[] ++ ys = ys
(x:xs) ++ ys = x:(xs ++ ys)
```

We obtained:

Now we can write:

```
reverse xs = reverseCat xs []
```

# Properties of program schemes

#### Program schemes and their properties

- Use of program schemes (higher-order functions) improves modularity of programs
- Applies not only to programming but also to proving
- Use of properties of program schemes improves modularity of proofs, and hence understanding, modification, and reuse
- Example: map preserves identity and composition

```
map id = id
map (f . g) = map f . map g
```

Example: polymorphism of concat

```
map f . concat = concat . map (map f)
```



#### foldr fusion

```
foldr :: (a \rightarrow b \rightarrow b) \rightarrow b \rightarrow [a] \rightarrow b
foldr (\otimes) z [] = z
foldr (\otimes) z (x:xs) = x \otimes foldr z xs
```

#### Example:

```
\begin{array}{c} \text{list} = 1 \,:\, (2 \,:\, (3 \,:\, (4 \,:\, (5 \,:\, [])))) \\ \text{foldr} \otimes z \ \text{list} = 1 \otimes (2 \otimes (3 \otimes (4 \otimes (5 \otimes z)))) \end{array}
```

## foldr fusion

## Example:

```
list = 1 : (2 : (3 : (4 : (5 : []))))
   foldr \otimes z list = 1 \otimes (2 \otimes (3 \otimes (4 \otimes (5 \otimes z))))
Suppose f (x \otimes y) = x \boxplus f y for all x, y
   f (foldr (\otimes) z list) = f (1 \otimes (2 \otimes (3 \otimes (4 \otimes (5 \otimes z)))))
                                      = 1 \boxplus f (2 \otimes (3 \otimes (4 \otimes (5 \otimes z))))
                                      = 1 \boxplus (2 \boxplus f (3 \otimes (4 \otimes (5 \otimes z))))
                                      = 1 \boxplus (2 \boxplus (3 \boxplus f (4 \otimes (5 \otimes z))))
                                      = 1 \boxplus (2 \boxplus (3 \boxplus f (4 \boxplus (5 \boxplus f z))))
                                      = foldr (\boxplus) (f z) list
```

### foldr fusion law

```
Captured by the foldr fusion law:
f (foldr (\otimes) z xs) = foldr (\boxplus) (f z) xs if for all x y: f (x \otimes y) =x \boxplus f y
Example: Suppose we want to prove that
  sum xs + a = foldr (+) 0 xs + a = foldr (+) a xs
What are f, (\otimes), (\boxplus)?
  f = (+ a)
  (\otimes) = (+)
  (\boxplus) = (+)
```

```
f. foldr g z = foldr h (f z) if \forall x y: f (g x y) = h x (f y)
We want to prove: reverse . reverse = id
First, we write reverse and id as folds
  reverse = foldr (\a r \rightarrow r ++ [a]) []
  id = foldr (:) []
Filling in the FF-law:
  reverse . foldr (\a r \rightarrow r ++ [a]) [] = foldr (:) []
Hence
  f = reverse
  g = \langle a r \rightarrow r ++ [a] \rangle
  h = (:)
```

```
f. foldr g z = foldr h (f z) if \forall x y: f (g x y) = h x (f y)
We want to prove: reverse . reverse = id
Filling in the FF-law:
  reverse . foldr (\a r \rightarrow r ++ [a]) [] = foldr (:) []
Hence
  f = reverse
  g = \langle a r \rightarrow r ++ [a] \rangle
  h = (:)
```

To complete proof it suffices to show that

1. [] = f []  
2. 
$$f(g \times y)$$
 =  $h \times (f y)$ 

```
f. foldr g z = foldr h (f z) if \forall x y: f (g x y) = h x (f y)
We want to prove: reverse \cdot reverse = id
Filling in the FF-law:
  reverse . foldr (\a r \rightarrow r ++ [a]) [] = foldr (:) []
Hence
  f = reverse
  g = \langle a r \rightarrow r ++ [a] \rangle
  h = (:)
```

To complete proof it suffices to show that

1. [] = reverse [] 2. reverse  $(y ++ [x]) = (:) \times (reverse y)$ 

```
f. foldr g z = foldr h (f z) if \forall x y: f (g x y) = h x (f y)
We want to prove: reverse \cdot reverse = id
Filling in the FF-law:
  reverse . foldr (\a r \rightarrow r ++ [a]) [] = foldr (:) []
Hence
  f = reverse
  g = \langle a r \rightarrow r ++ [a] \rangle
  h = (:)
```

To complete proof it suffices to show that

1. [] = reverse [] 2. reverse (y ++ [x]) = x : (reverse y)

```
f. foldr g z = foldr h (f z) if \forall x y: f (g x y) = h x (f y)
1. [] = reverse [] { definition of reverse }
2. reverse (y ++ [x])
  = { property reverse—append }
   reverse [x] ++ reverse y
  = { property reverse—singleton }
   [x] ++ reverse y
  = \{  list notation, definition of ++ \}
   x : reverse y
```

# Induction on natural numbers

### Induction on natural numbers

Prove that for all  $n \ge 0$ , property P(n) holds

Proof by induction on n, two cases:

- Base case: prove P(0)
- Inductive step: assume that P(n) holds, prove P(n+1)

# take $n \times s ++ drop \times n \times s = xs$

```
take :: Int \rightarrow [a] \rightarrow [a]
  take 0 = []
  take [] = []
  take n(x:xs) = x : take (n-1) xs
  drop :: Int \rightarrow [a] \rightarrow [a]
  drop 0 xs = xs
  drop [] = []
  drop \ n \ (x:xs) = drop \ (n-1) \ xs
Prove that \forall n \ge 0, xs::[a]: take n xs ++ drop n xs = xs
```

### take n xs ++ drop n xs = xs

### Proof by induction on n

- Base case: n = 0
   to prove ∀ xs take 0 xs ++ drop 0 xs = xs
- Inductive case: Assume IH:  $\forall$  xs take n xs ++ drop n xs = xs to prove  $\forall$  xs take (n+1) xs ++ drop (n+1) xs = xs

```
take 0 _ = []
take _ [] = []
take n (x:xs) = x : take (n-1) xs
drop 0 xs = xs
drop _ [] = []
drop n (x:xs) = drop (n-1) xs
```

## take $n \times s + + drop \times n \times s = xs$

```
Base case: n = 0
  take 0 xs ++ drop 0 xs
  = { definition of take }
  [] ++ drop 0 xs
  = { definition of drop }
  [] ++ xs
  = { definition of ++ }
  xs
```

```
take 0 _ = []
take _ [] = []
take n (x:xs) = x : take (n-1) xs
drop 0 xs = xs
drop _ [] = []
drop n (x:xs) = drop (n-1) xs
```

#### take n xs ++ drop n xs = xs

Inductive case

Case xs = []

Assume IH:  $\forall$  xs: take n xs ++ drop n xs = xs

Prove:  $\forall$  xs: take (n+1) xs ++ drop (n+1) xs = xs

```
We make a case distinction
```

take (n+1) [] ++ drop (n+1) [] take (n+1) (a:as) ++ drop (n+1) (a:as) = { definition of take, drop }

[] ++ [] $= \{ definition of ++ \}$ 

Case xs = a : as

 $= \{ H \}$ a:as

= { definition of take, drop } (a:take n as) ++ drop n as

 $= \{ definition of ++ \}$ 

take 0 = []take [] = []

drop 0 xs = xsdrop [] = []

a:(take n as ++ drop n as)

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take n(x:xs) = x : take (n-1) xs

 $drop \ n \ (x:xs) = drop \ (n-1) \ xs$ 

Take away

## The art of functional verification

- equational reasoning: substitution of equals for equals
- recursion and induction are two sides of the same coin
- explicit (ad-hoc) recursion and induction
   versus canned recursion and the use of laws
- after-the-fact verification
  - ... versus calculating a program from a specification