PROGRAMMING LANGUAGES: FUNCTIONAL PROGRAMMING

3. DEFINITION AND PROOF BY INDUCTION

Shin-Cheng Mu Spring 2022

National Taiwan University and Academia Sinica

TOTAL FUNCTIONAL PROGRAMMING

- The next few lectures concerns inductive definitions and proofs of datatypes and programs.
- While Haskell provides allows one to define nonterminating functions, infinite data structures, for now we will only consider its total, finite fragment.
- · That is, we temporarily
 - · consider only finite data structures,
 - demand that functions terminate for all value in its input type, and
 - provide guidelines to construct such functions.
- Infinite datatypes and non-termination will be discussed later in this course.

INDUCTION ON NATURAL NUMBERS

THE SO-CALLED "MATHEMATICAL INDUCTION"

- Let *P* be a predicate on natural numbers.
- We've all learnt this principle of proof by induction: to prove that P holds for all natural numbers, it is sufficient to show that
 - · P0 holds;
 - P(1+n) holds provided that Pn does.

PROOF BY INDUCTION ON NATURAL NUMBERS

 We can see the above inductive principle as a result of seeing natural numbers as defined by the datatype ¹

data
$$Nat = 0 \mid \mathbf{1}_{+} Nat$$
.

- That is, any natural number is either 0, or 1₊ n where n is a natural number.
- In this lecture, 1₊ is written in bold font to emphasise that it is a data constructor (as opposed to the function (+), to be defined later, applied to a number 1).

¹Not a real Haskell definition.

A PROOF GENERATOR

Given P0 and Pn \Rightarrow P (1₊ n), how does one prove, for example, P3?

$$P (1_{+} (1_{+} (1_{+} 0))) \\
\Leftarrow \{ P (1_{+} n) \Leftarrow Pn \} \\
P (1_{+} (1_{+} 0)) \\
\Leftarrow \{ P (1_{+} n) \Leftarrow Pn \} \\
P (1_{+} 0) \\
\Leftarrow \{ P (1_{+} n) \Leftarrow Pn \} \\
P 0 .$$

Having done math. induction can be seen as having designed a program that generates a proof — given any n :: Nat we can generate a proof of Pn in the manner above.

INDUCTIVELY DEFINED FUNCTIONS

 Since the type Nat is defined by two cases, it is natural to define functions on Nat following the structure:

$$exp$$
 :: $Nat \rightarrow Nat \rightarrow Nat$
 $exp \ b \ 0$ = 1
 $exp \ b \ (\mathbf{1}_+ \ n) = b \times exp \ b \ n$.

· Even addition can be defined inductively

(+) ::
$$Nat \to Nat \to Nat$$

 $0 + n = n$
 $(1_+ m) + n = 1_+ (m + n)$.

• Exercise: define (\times) ?

A VALUE GENERATOR

Given the definition of exp, how does one compute exp b 3?

```
exp \ b \ (1_+ \ (1_+ \ (1_+ \ 0)))
= \{ definition of exp \} 
b \times exp \ b \ (1_+ \ (1_+ \ 0))
= \{ definition of exp \} 
b \times b \times exp \ b \ (1_+ \ 0)
= \{ definition of exp \} 
b \times b \times b \times exp \ b \ 0
= \{ definition of exp \} 
b \times b \times b \times b \times 1 .
```

It is a program that generates a value, for any n :: Nat. Compare with the proof of P above.

MORAL: PROVING IS PROGRAMMING

An inductive proof is a program that generates a proof for any given natural number.

An inductive program follows the same structure of an inductive proof.

Proving and programming are very similar activities.

WITHOUT THE n + k PATTERN

• Unfortunately, newer versions of Haskell abandoned the n+k pattern" used in the previous slides:

```
exp :: Int \rightarrow Int \rightarrow Int
exp b 0 = 1
exp b n = b × exp b (n - 1).
```

- Nat is defined to be Int in MiniPrelude.hs. Without MiniPrelude.hs you should use Int.
- For the purpose of this course, the pattern 1 + n reveals the correspondence between Nat and lists, and matches our proof style. Thus we will use it in the lecture.
- · Remember to remove them in your code.

- To prove properties about Nat, we follow the structure as well.
- E.g. to prove that $exp\ b\ (m+n) = exp\ b\ m \times exp\ b\ n$.
- One possibility is to preform induction on m. That is, prove Pm for all m:Nat, where $Pm \equiv (\forall n: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n)$.

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := 0. For all n, we reason:
exp \ b \ (0+n)
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).

Case m := 0. For all n, we reason:
exp \ b \ (0+n)
= \{ defn. of (+) \}
exp \ b \ n
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).

Case m := 0. For all n, we reason:
exp \ b \ (0+n)
= \{ defn. of (+) \}
exp \ b \ n
= \{ defn. of (×) \}
1 \times exp \ b \ n
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := 0. For all n, we reason:
          exp b (0+n)
      = { defn. of (+) }
          exp b n
      = { defn. of (x) }
          1 \times \exp b n
      = { defn. of exp }
          \exp b 0 \times \exp b n.
```

We have thus proved P 0.

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := \mathbf{1}_+ \ m. For all n, we reason:
exp \ b \ ((\mathbf{1}_+ \ m) + n)
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := \mathbf{1}_+ m. For all n, we reason:
exp \ b \ ((\mathbf{1}_+ \ m) + n)
= \{ defn. of (+) \}
exp \ b \ (\mathbf{1}_+ \ (m+n))
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := \mathbf{1}_+ m. For all n, we reason:
exp \ b \ ((\mathbf{1}_+ m) + n)
= \{ defn. \ of \ (+) \}
exp \ b \ (\mathbf{1}_+ (m+n))
= \{ defn. \ of \ exp \}
b \times exp \ b \ (m+n)
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := 1_+ m. For all n, we reason:
           \exp b ((1 + m) + n)
      = { defn. of (+) }
           \exp b (1_{+} (m+n))
      = { defn. of exp }
           b \times \exp b (m + n)
      = { induction }
           b \times (exp \ b \ m \times exp \ b \ n)
```

```
Recall Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).
Case m := 1_+ m. For all n, we reason:
           \exp b ((1_+ m) + n)
      = { defn. of (+) }
           \exp b (1_{+} (m+n))
      = { defn. of exp }
           b \times \exp b (m + n)
      = { induction }
           b \times (exp \ b \ m \times exp \ b \ n)
      = \{ (x) \text{ associative } \}
           (b \times exp \ b \ m) \times exp \ b \ n
```

Recall $Pm \equiv (\forall n :: exp \ b \ (m+n) = exp \ b \ m \times exp \ b \ n).$

Case $m := \mathbf{1}_+ m$. For all n, we reason:

$$exp \ b \ ((1_+ \ m) + n)$$
= { defn. of (+) }
 $exp \ b \ (1_+ \ (m + n))$
= { defn. of exp }
 $b \times exp \ b \ (m + n)$
= { induction }
 $b \times (exp \ b \ m \times exp \ b \ n)$
= { (×) associative }
(b \times exp \ b \ m) \times exp \ b \ n
= { defn. of exp }
 $exp \ b \ (1_+ \ m) \times exp \ b \ n$.

We have thus proved P(1+m), given Pm.

STRUCTURE PROOFS BY PROGRAMS

- The inductive proof could be carried out smoothly, because both (+) and *exp* are defined inductively on its lefthand argument (of type *Nat*).
- The structure of the proof follows the structure of the program, which in turns follows the structure of the datatype the program is defined on.

LISTS AND NATURAL NUMBERS

- We have yet to prove that (\times) is associative.
- The proof is quite similar to the proof for associativity of (++), which we will talk about later.
- In fact, Nat and lists are closely related in structure.
- Most of us are used to think of numbers as atomic and lists as structured data. Neither is necessarily true.
- For the rest of the course we will demonstrate induction using lists, while taking the properties for *Nat* as given.

AN INDUCTIVELY DEFINED SET?

- For a set to be "inductively defined", we usually mean that it is the *smallest* fixed-point of some function.
- · What does that maen?

FIXED-POINT AND PREFIXED-POINT

- A fixed-point of a function f is a value x such that fx = x.
- **Theorem**. *f* has fixed-point(s) if *f* is a *monotonic function* defined on a complete lattice.
 - In general, given f there may be more than one fixed-point.
- A prefixed-point of f is a value x such that $fx \le x$.
 - Apparently, all fixed-points are also prefixed-points.
- Theorem. the smallest prefixed-point is also the smallest fixed-point.

EXAMPLE: Nat

- Recall the usual definition: Nat is defined by the following rules:
 - 1. 0 is in *Nat*:
 - 2. if n is in Nat, so is $\mathbf{1}_{+}$ n;
 - 3. there is no other Nat.
- · 3. means that we want the smallest such prefixed-point.
- Thus *Nat* is also the least (smallest) fixed-point of *F*.

LEAST PREFIXED-POINT

Formally, let $FX = \{0\} \cup \{1_+ \ n \mid n \in X\}$, Nat is a set such that

$$FNat \subseteq Nat$$
, (1)

$$(\forall X : FX \subseteq X \Rightarrow Nat \subseteq X) , \qquad (2)$$

where (1) says that Nat is a prefixed-point of F, and (2) it is the least among all prefixed-points of F.

MATHEMATICAL INDUCTION, FORMALLY

- Given property *P*, we also denote by *P* the set of elements that satisfy *P*.
- That P0 and Pn \Rightarrow P (1+n) is equivalent to $\{0\} \subseteq P$ and $\{1_+ \ n \mid n \in P\} \subseteq P$,
- which is equivalent to $FP \subseteq P$. That is, P is a prefixed-point!
- By (2) we have $Nat \subseteq P$. That is, all Nat satisfy P!
- This is "why mathematical induction is correct."

COINDUCTION?

There is a dual technique called *coinduction* where, instead of least prefixed-points, we talk about *greatest postfixed points*. That is, largest x such that $x \le fx$.

With such construction we can talk about infinite data structures.

INDUCTION ON LISTS

INDUCTIVELY DEFINED LISTS

 \cdot Recall that a (finite) list can be seen as a datatype defined by: 2

$$data \ List \ a = [] \mid a : List \ a$$
.

• Every list is built from the base case [], with elements added by (:) one by one: [1, 2, 3] = 1 : (2 : (3 : [])).

²Not a real Haskell definition.

ALL LISTS TODAY ARE FINITE

But what about infinite lists?

- For now let's consider finite lists only, as having infinite lists make the *semantics* much more complicated. ³
- In fact, all functions we talk about today are total functions. No \perp involved.

³What does that mean? We will talk about it later.

SET-THEORETICALLY SPEAKING...

The type *List a* is the *smallest* set such that

- 1. [] is in List a;
- 2. if xs is in List a and x is in a, x : xs is in List a as well.

INDUCTIVELY DEFINED FUNCTIONS ON LISTS

 Many functions on lists can be defined according to how a list is defined:

```
sum :: List Int \rightarrow Int

sum [] = 0

sum (x : xs) = x + sum xs .

map :: (a \rightarrow b) \rightarrow List a \rightarrow List b

map f[] = []

map f(x : xs) = fx : map fxs .
```

LIST APPEND

• The function (++) appends two lists into one

```
(++) :: List a \rightarrow \text{List } a \rightarrow \text{List } a

[] ++ ys = ys

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

• Compare the definition with that of (+)!

PROOF BY STRUCTURAL INDUCTION ON LISTS

- Recall that every finite list is built from the base case [], with elements added by (:) one by one.
- To prove that some property P holds for all finite lists, we show that
 - P [] holds;
 - 2. forall x and xs, P(x:xs) holds provided that Pxs holds.

FOR A PARTICULAR LIST...

Given P[] and $Pxs \Rightarrow P(x:xs)$, for all x and xs, how does one prove, for example, P[1,2,3]?

```
P (1:2:3:[])

← { P(x:xs) \leftarrow Pxs }

P (2:3:[])

← { P(x:xs) \leftarrow Pxs }

P (3:[])

← { P(x:xs) \leftarrow Pxs }

P [].
```

APPENDING IS ASSOCIATIVE

```
To prove that xs ++(ys ++ zs) = (xs ++ ys) ++ zs.

Let Pxs = (\forall ys, zs :: xs ++(ys ++ zs) = (xs ++ ys) ++ zs), we prove P by induction on xs.
```

Case xs := []. For all ys and zs, we reason:

We have thus proved P [].

APPENDING IS ASSOCIATIVE

Case xs := x : xs. For all ys and zs, we reason:

We have thus proved P(x:xs), given Pxs.

Do We Have To Be So Formal?

- In our style of proof, every step is given a reason. Do we need to be so pedantic?
- · Being formal *helps* you to do the proof:
 - In the proof of $exp\ b\ (m+n) = exp\ b\ m \times exp\ b\ n$, we expect that we will use induction to somewhere. Therefore the first part of the proof is to generate $exp\ b\ (m+n)$.
 - In the proof of associativity, we were working toward generating xs ++(ys ++ zs).
- By being formal we can work on the form, not the meaning. Like how we solved the knight/knave problem
- Being formal actually makes the proof easier!
- · Make the symbols do the work.

LENGTH

· The function *length* defined inductively:

```
\begin{array}{ll} \mbox{length} & :: \mbox{List } a \rightarrow \mbox{Nat} \\ \mbox{length} \left[ \right] & = 0 \\ \mbox{length} \left( x : xs \right) = \mathbf{1}_{+} \left( \mbox{length} \ xs \right) \; . \end{array}
```

• Exercise: prove that *length* distributes into (++):

length(xs + ys) = length(xs + length(ys))

CONCATENATION

 While (++) repeatedly applies (:), the function concat repeatedly calls (++):

```
concat :: List (List a) \rightarrow List a concat [] = [] concat (xs : xss) = xs ++ concat xss .
```

- · Compare with sum.
- Exercise: prove $sum \cdot concat = sum \cdot map sum$.

DEFINITION BY INDUCTION/RECURSION

- Rather than giving commands, in functional programming we specify values; instead of performing repeated actions, we define values on inductively defined structures.
- Thus induction (or in general, recursion) is the only "control structure" we have. (We do identify and abstract over plenty of patterns of recursion, though.)
- To inductively define a function f on lists, we specify a value for the base case (f []) and, assuming that f xs has been computed, consider how to construct f (x : xs) out of f xs.

FILTER

• filter p xs keeps only those elements in xs that satisfy p.

```
filter :: (a \rightarrow Bool) \rightarrow List \ a \rightarrow List \ a

filter p [] = []

filter p (x : xs) | p x = x : filter p xs

| otherwise = filter p xs .
```

TAKE AND DROP

 Recall take and drop, which we used in the previous exercise.

```
take
         :: Nat \rightarrow List a \rightarrow List a
take 0 xs = []
take (1_+ n)[] = []
take (1_+ n) (x : xs) = x : take n xs.
             :: Nat \rightarrow List a \rightarrow List a
drop
drop 0 xs = xs
drop (1_+ n) [] = []
drop(\mathbf{1}_{+} n)(x:xs) = drop n xs.
```

• Prove: take $n \times x + drop \times n \times x = x x$, for all n and x x.

TAKEWHILE AND DROPWHILE

• *takeWhile p xs* yields the longest prefix of xs such that *p* holds for each element.

```
takeWhile :: (a \rightarrow Bool) \rightarrow List \ a \rightarrow List \ a
takeWhile p [] = []
takeWhile p (x : xs) | p x = x : takeWhile p xs
| otherwise = [] .
```

· dropWhile p xs drops the prefix from xs.

```
dropWhile :: (a \rightarrow Bool) \rightarrow List \ a \rightarrow List \ a
dropWhile p [] = []
dropWhile p (x : xs) | p \ x = dropWhile \ p \ xs
| otherwise = x : xs .
```

• Prove: takeWhile $p \times s ++ dropWhile p \times s = xs$.

LIST REVERSAL

```
• reverse [1,2,3,4] = [4,3,2,1].

reverse :: List a \rightarrow List a

reverse [] = []

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

ALL PREFIXES AND SUFFIXES

```
• inits [1, 2, 3] = [[], [1], [1, 2], [1, 2, 3]]
        inits :: List a \rightarrow List (List a)
        inits [] = []
        inits (x : xs) = [] : map(x :) (inits xs).
• tails [1, 2, 3] = [[1, 2, 3], [2, 3], [3], []]
        tails :: List a \rightarrow List (List a)
        tails [] = [[]]
        tails (x : xs) = (x : xs) : tails xs.
```

TOTALITY

· Structure of our definitions so far:

```
f[] = \dots
f(x : xs) = \dots f xs \dots
```

- Both the empty and the non-empty cases are covered, guaranteeing there is a matching clause for all inputs.
- The recursive call is made on a "smaller" argument, guranteeing termination.
- Together they guarantee that every input is mapped to some output. Thus they define *total* functions on lists.

VARIATIONS WITH THE BASE CASE

Some functions discriminate between several base cases.
 E.g.

```
fib :: Nat \rightarrow Nat
fib 0 = 0
fib 1 = 1
fib (2+n) = fib (1+n) + fib n.
```

 Some functions make more sense when it is defined only on non-empty lists:

```
f[x] = \dots
f(x : xs) = \dots
```

- What about totality?
 - They are in fact functions defined on a different datatype:

$$data List^+ a = Singleton a | a : List^+ a$$
.

- We do not want to define map, filter again for List⁺ a. Thus
 we reuse List a and pretend that we were talking about
 List⁺ a.
- · It's the same with Nat. We embedded Nat into Int.
- Ideally we'd like to have some form of *subtyping*. But that makes the type system more complex.

LEXICOGRAPHIC INDUCTION

- It also occurs often that we perform *lexicographic induction* on multiple arguments: some arguments decrease in size, while others stay the same.
- E.g. the function merge merges two sorted lists into one sorted list:

```
merge :: List Int \rightarrow List Int \rightarrow List Int merge [] [] = []
merge [] (y : ys) = y : ys
merge (x : xs) [] = x : xs
merge (x : xs) (y : ys) | x \le y = x : merge xs (y : ys)
| otherwise = y : merge (x : xs) ys .
```

ZIP

Another example:

```
zip :: List a \rightarrow List b \rightarrow List (a, b)

zip [] [] = []

zip [] (y : ys) = []

zip (x : xs) [] = []

zip (x : xs) (y : ys) = (x, y) : zip xs ys .
```

Non-Structural Induction

- In most of the programs we've seen so far, the recursive call are made on direct sub-components of the input (e.g. f(x:xs) = ..fxs..). This is called *structural induction*.
 - It is relatively easy for compilers to recognise structural induction and determine that a program terminates.
- In fact, we can be sure that a program terminates if the arguments get "smaller" under some (well-founded) ordering.

MERGESORT

• In the implemenation of mergesort below, for example, the arguments always get smaller in size.

```
msort :: List Int \rightarrow List Int

msort [] = []

msort [x] = [x]

msort xs = merge (msort ys) (msort zs) ,

where n = length xs 'div' 2

ys = take n xs

zs = drop n xs .
```

- What if we omit the case for [x]?
- If all cases are covered, and all recursive calls are applied to smaller arguments, the program defines a total function.

A Non-Terminating Definition

• Example of a function, where the argument to the recursive does not reduce in size:

```
f :: Int \rightarrow Int

f0 = 0

fn = fn.
```

• Certainly *f* is not a total function. Do such definitions "mean" something? We will talk about these later.



INTERNALLY LABELLED BINARY TREES

 This is a possible definition of internally labelled binary trees:

```
data Tree a = Null | Node a (Tree a) (Tree a),
```

· on which we may inductively define functions:

```
sumT :: Tree Nat \rightarrow Nat

sumT Null = 0

sumT (Node x t u) = x + sumT t + sumT u .
```

Exercise: given (\downarrow) :: $Nat \rightarrow Nat$, which yields the smaller one of its arguments, define the following functions

- 1. $minT :: Tree \ Nat \rightarrow Nat$, which computes the minimal element in a tree.
- 2. $mapT :: (a \rightarrow b) \rightarrow Tree \ a \rightarrow Tree \ b$, which applies the functional argument to each element in a tree.
- 3. Can you define (\(\) inductively on Nat? 4

⁴In the standard Haskell library, (\downarrow) is called *min*.

INDUCTION PRINCIPLE FOR Tree

- · What is the induction principle for *Tree*?
- To prove that a predicate P on Tree holds for every tree, it is sufficient to show that

INDUCTION PRINCIPLE FOR Tree

- · What is the induction principle for *Tree*?
- To prove that a predicate P on Tree holds for every tree, it is sufficient to show that
 - 1. P Null holds, and;
 - 2. for every x, t, and u, if P t and P u holds, P (Node x t u) holds.

INDUCTION PRINCIPLE FOR Tree

- · What is the induction principle for *Tree*?
- To prove that a predicate P on Tree holds for every tree, it is sufficient to show that
 - 1. P Null holds, and;
 - 2. for every x, t, and u, if P t and P u holds, P (Node x t u) holds.
- Exercise: prove that for all n and t, minT(mapT(n+)t) = n + minTt. That is, $minT \cdot mapT(n+) = (n+) \cdot minT$.

INDUCTION PRINCIPLE FOR OTHER TYPES

- Recall that data Bool = False | True. Do we have an induction principle for Bool?
- To prove a predicate P on Bool holds for all booleans, it is sufficient to show that

INDUCTION PRINCIPLE FOR OTHER TYPES

- Recall that data Bool = False | True. Do we have an induction principle for Bool?
- To prove a predicate P on Bool holds for all booleans, it is sufficient to show that
 - 1. P False holds, and
 - 2. P True holds.
- Well, of course.

- What about $(A \times B)$? How to prove that a predicate P on $(A \times B)$ is always true?
- One may prove some property P_1 on A and some property P_2 on B, which together imply P.
- That does not say much. But the "induction principle" for products allows us to extract, from a proof of P, the proofs P_1 and P_2 .

- Every inductively defined datatype comes with its induction principle.
- We will come back to this point later.