



CS 3110

Induction and Recursion

Prof. Clarkson

Fall 2015

Today's music: *Dream within a Dream*
from the soundtrack to *Inception* by Hans Zimmer

Review

Previously in 3110:

- Behavioral equivalence
- Proofs of correctness by induction on naturals

Today:

- Induction on lists
- Induction on trees

Review: Induction on natural numbers

Theorem:

for all natural numbers n , $P(n)$.

Proof: by induction on n

Case: $n = 0$

Show: $P(0)$

Case: $n = k+1$

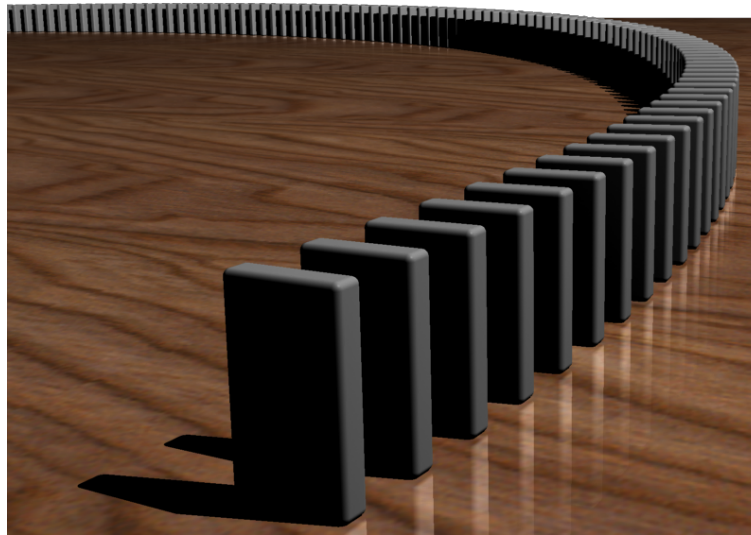
IH: $P(k)$

Show: $P(k+1)$

QED

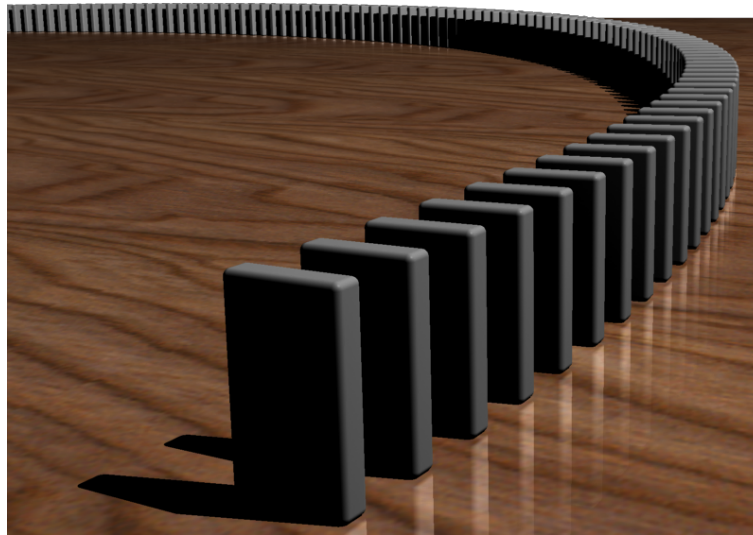
Induction principle

for all properties P of natural numbers,
if $P(0)$
and (for all n ,
 $P(n)$ implies $P(n+1)$)
then (for all n , $P(n)$)



Induction principle

for all properties P of `lists`,
if $P([])$
and (for all x and xs ,
 $P(xs)$ implies $P(x :: xs)$)
then (for all xs , $P(xs)$)



Induction on lists

Theorem:

for all lists lst , $P(lst)$.

Proof: by induction on lst

Case: $n = []$

Show: $P([])$

Case: $n = h::t$

IH: $P(t)$

Show: $P(h::t)$

QED

Append

```
let rec length = function
| [] -> 0
| _::xs -> 1 + length xs
```

```
let rec append xs1 xs2 = match xs1 with
| [] -> xs2
| h::t -> h :: append t xs2
```

Theorem.

for all lists xs and ys,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

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| [] -> 0
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Theorem.

for all lists xs and ys,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

Proof: by induction on xs

Case: $xs = []$

Show: for all ys,

$\text{length } (\text{append } [] \text{ } ys) \sim \text{length } [] + \text{length } ys$

$\text{length } (\text{append } [] \text{ } ys)$	
$\sim \text{length } ys$	(eval)
$\sim 0 + \text{length } ys$	(math)
$\sim \text{length } [] + \text{length } ys$	(eval,symm.)

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let rec length = function
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| [] -> xs2
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Theorem.

for all lists xs and ys,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

Proof: by induction on xs

Case: $xs = h::t$

Show: for all ys, $\text{length } (\text{append } (h::t) \text{ } ys) \sim \text{length } (h::t) + \text{length } ys$

IH: ??

Question

If we're trying to prove

for all lists xs and ys ,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

by induction on xs , in the case where $xs = h :: t$, what is the inductive hypothesis?

- A. for all ys ,
 $\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys$
- B. for all ys ,
 $\text{length } (\text{append } t \text{ } ys) \sim \text{length } t + \text{length } ys$
- C. for all ys ,
 $\text{length } (\text{append } (h :: t) \text{ } ys)$
 $\sim \text{length } (h :: t) + \text{length } ys$
- D. for all h' and t' ,
 $\text{length } (\text{append } (h :: t) \text{ } (h' :: t'))$
 $\sim \text{length } (h :: t) + \text{length } (h' :: t')$
- E. for all xs ,
 $\text{length } (\text{append } xs \text{ } t) \sim \text{length } xs + \text{length } t$

Question

If we're trying to prove

for all lists xs and ys ,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

by induction on xs , in the case where $xs = h :: t$, what is the inductive hypothesis?

- A. for all ys ,
 $\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys$
- B. for all ys ,
 $\text{length } (\text{append } t \text{ } ys) \sim \text{length } t + \text{length } ys$
- C. for all ys ,
 $\text{length } (\text{append } (h :: t) \text{ } ys)$
 $\sim \text{length } (h :: t) + \text{length } ys$
- D. for all h' and t' ,
 $\text{length } (\text{append } (h :: t) \text{ } (h' :: t'))$
 $\sim \text{length } (h :: t) + \text{length } (h' :: t')$
- E. for all xs ,
 $\text{length } (\text{append } xs \text{ } t) \sim \text{length } xs + \text{length } t$

Append

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let rec length = function
| [] -> 0
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let rec append xs1 xs2 = match xs1 with
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Theorem.

for all lists xs and ys,

$\text{length } (\text{append } xs \text{ } ys) \sim \text{length } xs + \text{length } ys.$

Proof: by induction on xs

Case: $xs = h::t$

Show: for all ys, $\text{length } (\text{append } (h::t) \text{ } ys)$
 $\sim \text{length } (h::t) + \text{length } ys$

IH: for all ys, $\text{length } (\text{append } t \text{ } ys)$
 $\sim \text{length } t + \text{length } ys$

Append

```
let rec length = function
| [] -> 0
| _::xs -> 1 + length xs

let rec append xs1 xs2 = match xs1 with
| [] -> xs2
| h::t -> h :: append t xs2
```

Case: xs is $h::t$

Show: for all ys , $\text{length} (\text{append} (h::t) ys)$
 $\sim \text{length} (h::t) + \text{length} ys$

IH: for all ys , $\text{length} (\text{append } t \text{ } ys)$
 $\sim \text{length } t + \text{length} ys$

$\text{length} (\text{append} (h::t) ys)$	
$\sim \text{length} (h :: \text{append } t \text{ } ys)$	(eval)
$\sim 1 + \text{length} (\text{append } t \text{ } ys)$	(eval)
$\sim 1 + \text{length } t + \text{length } ys$	(IH, congr.)
$\sim \text{length} (h::t) + \text{length } ys$	(eval, summ.)

QED

From now on, omit
many uses of `symm.`,
`trans.`, `congr.`

Higher-order functions

Proofs about higher-order functions sometimes need an additional axiom:

Extensionality:

if (for all x , $(f\ x) \sim (g\ x)$)

then $f \sim g$

Compose

```
let (++) f g x = f (g x)
```

```
let map = List.map
```

Theorem:

for all functions f and g ,

$$(\text{map } f) \text{ } ++ (\text{map } g) \sim \text{map } (f \text{ } ++ g).$$

Proof:

By extensionality, we need to show that for all xs ,

$$((\text{map } f) \text{ } ++ (\text{map } g)) \text{ } xs \sim \text{map } (f \text{ } ++ g) \text{ } xs.$$

By eval, $((\text{map } f) \text{ } ++ (\text{map } g)) \text{ } xs \sim \text{map } f \text{ } (\text{map } g \text{ } xs)$.

So by transitivity, it suffices to show that

$$\text{map } f \text{ } (\text{map } g \text{ } xs) \sim \text{map } (f \text{ } ++ g) \text{ } xs.$$

```
let (++) f g x = f (g x)
let map = List.map
```

Compose

Show: $\text{map } f (\text{map } g \text{ xs}) \sim \text{map } (f \text{ } ++ \text{ } g) \text{ xs}.$

Proof: by induction on xs

Case: $\text{xs} = []$

Show: $\text{map } f (\text{map } g []) \sim \text{map } (f \text{ } ++ \text{ } g) []$

$\text{map } f (\text{map } g [])$	
$\sim []$	(eval)
$\sim \text{map } (f \text{ } ++ \text{ } g) []$	(eval)


```
let (++) f g x = f (g x)
let map = List.map
```

Compose

Show: $\text{map } f (\text{map } g \text{ xs}) \sim \text{map } (f \text{ ++ } g) \text{ xs}.$

Proof: by induction on xs

Case: $\text{xs} = h :: t$

Show: $\text{map } f (\text{map } g (h :: t)) \sim \text{map } (f \text{ ++ } g) (h :: t)$

IH: $\text{map } f (\text{map } g t) \sim \text{map } (f \text{ ++ } g) t$

$$\begin{aligned} & \text{map } f (\text{map } g (h :: t)) \\ & \sim \text{map } f ((g \text{ h}) :: \text{map } g t) && (\text{eval map}) \\ & \sim (f (g \text{ h})) :: \text{map } f (\text{map } g t) && (\text{eval map}) \\ & \sim ((f \text{ ++ } g) \text{ h}) :: \text{map } f (\text{map } g t) && (\text{eval ++}) \\ & \sim ((f \text{ ++ } g) \text{ h}) :: \text{map } (f \text{ ++ } g) t && (\text{IH}) \\ & \sim \text{map } (f \text{ ++ } g) (h :: t) && (\text{eval map}) \end{aligned}$$

Helpful to
identify what
is being
evaluated

Compose

```
let (++) f g x = f (g x)
```

```
let map = List.map
```

Theorem:

for all functions f and g ,

$$(\text{map } f) \text{ } ++ (\text{map } g) \sim \text{map } (f \text{ } ++ g).$$

Proof:

By extensionality, we need to show that for all xs ,

$$((\text{map } f) \text{ } ++ (\text{map } g)) \text{ } xs \sim \text{map } (f \text{ } ++ g) \text{ } xs.$$

By eval, $((\text{map } f) \text{ } ++ (\text{map } g)) \text{ } xs \sim \text{map } f \text{ } (\text{map } g \text{ } xs).$

So by transitivity, it suffices to show that

$$\text{map } f \text{ } (\text{map } g \text{ } xs) \sim \text{map } (f \text{ } ++ g) \text{ } xs. \quad \text{We have.}$$

QED.

Compose

```
let (++) f g x = f (g x)
```

```
let map = List.map
```

Theorem:

for all functions f and g ,

$$(\text{map } f) \text{ } ++ (\text{map } g) \sim \text{map } (f \text{ } ++ g).$$

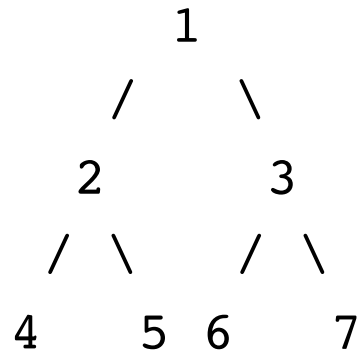
Comment: this theorem would be the basis for a nice compiler optimization in a pure language. Replace an operation that processes list twice with an operation that processes list only once.

Trees

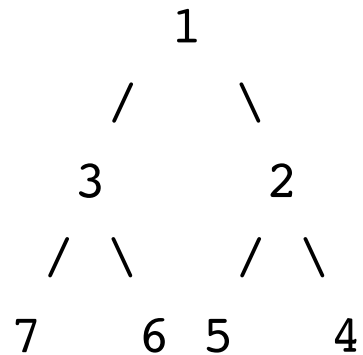
```
type 'a tree =  
  | Leaf  
  | Branch of 'a * 'a tree * 'a tree  
  
let rec reflect = function  
  | Leaf -> Leaf  
  | Branch(x,l,r) -> Branch(x, reflect r, reflect l)
```

Trees

reflection of



is



Trees

```
type 'a tree =  
  | Leaf  
  | Branch of 'a * 'a tree * 'a tree  
  
let rec reflect = function  
  | Leaf -> Leaf  
  | Branch(x,l,r) -> Branch(x, reflect l, reflect r)
```

Theorem: for all trees t , $\text{reflect}(\text{reflect } t) \sim t$.

Proof: by induction on t .

Induction principle

for all properties P of **trees**,

if $P(\mathbf{Leaf})$

and (for all x and l and r ,

$P(l)$ and $P(r)$ implies $P(\mathbf{Branch}(x, l, r))$)

then (for all t , $P(t)$)



Induction on trees

Theorem:

for all trees t , $P(t)$.

Proof: by induction on t

Case: $n = \text{Leaf}$

Show: $P(\text{Leaf})$

Case: $n = \text{Branch}(x, l, r)$

IH: $P(l)$ and $P(r)$

Show: $P(\text{Branch}(x, l, r))$

QED


```
let rec reflect = function
| Leaf -> Leaf
| Branch(x,l,r) -> Branch(x, reflect l, reflect r)
```

Trees

Theorem: for all trees t , $\text{reflect}(\text{reflect } t) \sim t$.

Proof: by induction on t .

Case: $t = \text{Leaf}$

Show: $\text{reflect}(\text{reflect Leaf}) \sim \text{Leaf}$

$\text{reflect}(\text{reflect Leaf})$
 $\sim \text{Leaf} \quad (\text{eval})$

```
let rec reflect = function
| Leaf -> Leaf
| Branch(x,l,r) -> Branch(x, reflect l, reflect r)
```

Trees

Theorem: for all trees t , $\text{reflect}(\text{reflect } t) \sim t$.

Proof: by induction on t .

Case: $t = \text{Branch}(x,l,r)$

Show:

$\text{reflect}(\text{reflect}(\text{Branch}(x,l,r))) \sim \text{Branch}(x,l,r)$

IH: ???

Question

How many formulas in inductive hypothesis—i.e., how many inductive hypotheses?

- A. 1 (for the Branch constructor)
- B. 2 (for the two subtrees)
- C. 3 (for the two subtrees and the node's label)

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How many formulas in inductive hypothesis—i.e., how many inductive hypotheses?

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C. 3 (for the two subtrees and the node's label)

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let rec reflect = function
| Leaf -> Leaf
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```

Trees

Theorem: for all trees t , $\text{reflect}(\text{reflect } t) \sim t$.

Proof: by induction on t .

Case: $t = \text{Branch}(x,l,r)$

Show:

$\text{reflect}(\text{reflect}(\text{Branch}(x,l,r))) \sim \text{Branch}(x,l,r)$

IH:

1. $\text{reflect}(\text{reflect } l) \sim l$
2. $\text{reflect}(\text{reflect } r) \sim r$

```
let rec reflect = function
| Leaf -> Leaf
| Branch(x,l,r) -> Branch(x, reflect l, reflect r)
```

Trees

Show:

$\text{reflect}(\text{reflect}(\text{Branch}(x,l,r))) \sim \text{Branch}(x,l,r)$

IH:

1. $\text{reflect}(\text{reflect } l) \sim l$
2. $\text{reflect}(\text{reflect } r) \sim r$

```
reflect(reflect(Branch(x,l,r)))
~ reflect(Branch(x, reflect r, reflect l))      (eval)
~ Branch(x, reflect(reflect l), reflect(reflect r)) (eval)
~ Branch(x, l, reflect(reflect r))              (IH 1)
~ Branch(x, l, r)                               (IH 2)
```

QED

Inductive proofs on variants

type $t = C1 \text{ of } t1 \mid \dots \mid Cn \text{ of } tn$

Theorem: for all $x:t$, $P(x)$

Proof: by induction on x

...

Case: $x = Ci \ y$

IH: $P(v)$ for any components $v:t$ of y

Show: $P(Ci \ y)$

...

QED

General induction principle

```
for all properties P of t,  
  if  
    (for all Ci,  
      (for all y,  
        (for all components z:t of y, P(z))  
        implies P(Ci y)))  
  then  
    (for all t, P(t))
```


Naturals

```
(* unary representation *)  
type nat = Z | S of nat
```

Theorem:

for all $n:\text{nat}$, $P(n)$

Proof: by induction on n

Case: $n = Z$

Show: $P(Z)$

Case: $n = S\ k$

IH: $P(k)$

Show: $P(S\ k)$

QED

Theorem:

for all naturals n , $P(n)$

Proof: by induction on n

Case: $n = 0$

Show: $P(0)$

Case: $x = k+1$

IH: $P(k)$

Show: $P(k+1)$

QED

Induction

- The kind of induction we've done today is called **structural induction**
 - Induct on the *structure* of a data type
 - Widely used in programming languages theory
- When naturals are coded up as variants, **weak induction** becomes structural induction
- Both structural induction and weak induction (and strong induction) are instances of a very general kind of induction called **well-founded induction**
 - see CS 4110

Induction and recursion

- Intense similarity between inductive proofs and recursive functions on variants
 - In proofs: one case per constructor
 - In functions: one pattern-matching branch per constructor
 - In proofs: uses IH on "smaller" value
 - In functions: uses recursive call on "smaller" value
- Inductive proofs truly are a kind of recursive programming (see *Curry-Howard isomorphism*, CS 4110)

Upcoming events

- [next Thursday] A5 due, including Async and design phase of project

This is inductive.

THIS IS 3110