### Why Types Matter

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#### **QOTD**

"Bad programmers worry about the code. Good programmers worry about data structures and their relationships." Linus Torvalds

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    - ► Haskell, OCaml, ML, ...

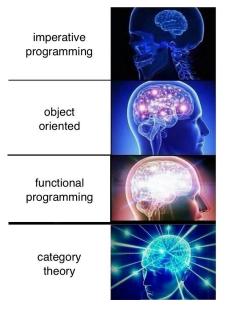
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- ► Today, while the OOP world is catching up with functional programming, Haskell is catching up with dependent types

#### The Levels



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- $(\lambda(x:Int) \mapsto x+1):Int \to Int$

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  - ▶  $A \oplus B$ , disjoint union of A and B
  - ▶  $A \otimes B$ , product of A and B

```
data Pair = MkPair Int String
-- MkPair :: Int -> String -> Pair
```

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data R3 = MkR3 Float Float Float
-- MkR3 :: Float -> Float -> Float -> R3
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data One = MkOne
-- MkOne :: One
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data B x = B x x
-- B :: x -> x -> B x
```

```
data Bool = True | False
-- True, False :: Bool
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data Bool = True | False
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data Maybe x = Nothing | Some x
-- Nothing :: Maybe x
-- Some :: x -> Maybe x
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data List x = Nil | Cons x (List x)
-- Nil :: List x
-- Cons :: x -> List x -> List x
```

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data Bool = True | False
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data Maybe x = Nothing | Some x
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data List x = Nil | Cons x (List x)
-- Nil :: List x
-- Cons :: x -> List x -> List x

data BinTree x = Leaf x | Branch (BinTree x) (BinTree x)
-- Leaf :: x -> BinTree x
-- Branch :: BinTree x -> BinTree x
```

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- What is a generating function?
- ▶ Given a combinatorial class A and a size function  $w: A \to \mathbb{N}$  we define A's ordinary generating function (OGF) as

$$A(x) = \sum_{a:A} x^{w(a)} = \sum_{n=0}^{\infty} a_n x^n$$

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▶ The numbers  $a_n$  tell us how many objects in A are of size n

# Symbolic Method: Finding generating functions

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- In the special case of algebraic data types, the symbolic method uses the fact that if A, B, C are types and A(x), B(x), C(x) are the corresponding OGFs then

$$C = A \oplus B \implies C(x) = A(x) + B(x)$$
  
and  
 $C = A \otimes B \implies C(x) = A(x)B(x)$ 

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For example

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data Foo x = F0 \mid F1 \mid x \mid F2 \mid x \mid F0 \mid x
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For example

data Foo 
$$x = F0 | F1 x | F2 x (Foo x)$$

$$Foo(x) = 1 + x + xFoo(x)$$



data Empty

data Empty

$$E(x) = 0$$

data Empty

$$E(x) = 0$$

data One = One

data Empty

$$E(x) = 0$$

data One = One

$$O(x)=1$$

data Empty

$$E(x) = 0$$

data One = One

$$O(x)=1$$

data Bool = True | False

data Empty

$$E(x) = 0$$

data One = One

$$O(x) = 1$$

data Bool = True | False

$$B(x) = 1 + 1$$

data Empty

$$E(x) = 0$$

data One = One

$$O(x) = 1$$

data Bool = True | False

$$B(x) = 1 + 1$$

$$B(x) = 2$$

data Maybe x = None | Just x

data Maybe  $x = None \mid Just x$ 

$$M(x) = 1 + x$$

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data  $L x = Nil \mid Cons x (L x)$ 

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data  $L x = Nil \mid Cons x (L x)$ 

$$L(x) = 1 + xL(x)$$

data Maybe  $x = None \mid Just x$ 

$$M(x) = 1 + x$$

data L x = Nil | Cons x (L x)

$$L(x) = 1 + xL(x)$$

$$L(x) = \frac{1}{1 - x}$$

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$$L(x) = \frac{1}{1 - x}$$

$$L(x) = 1 + x + x^2 + x^3 + x^4 + x^5 + x^6 + x^7 + \dots$$

```
data T x = Leaf x | Branch (T x) (T x)
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$$T(x) = x + x^2 + 2x^3 + 5x^4 + 14x^5 + 42x^6 + 132x^7 + \dots$$

```
data B x = B0 x | B1 x
data L x = Nil | Cons x (L x)
data Bits x = Bits (L (B x))
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$$B(x) = 2x$$

$$L(x) = 1 + xL(x)$$

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data B 
$$x = B0 x | B1 x$$
  
data L  $x = Ni1 | Cons x (L x)$   
data Bits  $x = Bits (L (B x))$ 

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$$L(x) = 1 + xL(x)$$

$$Bits(x) = L(B(x))$$

$$Bits(x) = \frac{1}{1 - 2x}$$

$$Bits(x) = 1 + 2x + 4x^2 + 8x^3 + 16x^4 + 32x^5 + 64x^6 + 128x^7 + \dots$$

```
data C x = C0 x | C1 x x
data L x = Nil | Cons x (L x)
data H = H0 (L (C x))
```

```
data C x = CO x | C1 x x data L x = Nil | Cons x (L x) data H = HO (L (C x))
```

$$C(x) = x + x2$$
  

$$L(x) = 1 + xL(x)$$
  

$$H(x) = L(C(x))$$

$$C(x) = x + x2$$
  

$$L(x) = 1 + xL(x)$$
  

$$H(x) = L(C(x))$$

$$H(x) = \frac{1}{1 - x - x^2}$$

$$C(x) = x + x2$$
  

$$L(x) = 1 + xL(x)$$
  

$$H(x) = L(C(x))$$

$$H(x) = \frac{1}{1 - x - x^2}$$

$$H(x) = 1 + x + 2x^2 + 3x^3 + 5x^4 + 8x^5 + 13x^6 + 21x^7 + \dots$$

```
data F x = F0 x | F1 (F (G x))
data G x = G0 x | G1 x (G x)
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data F x = F0 x | F1 (F (G x)) data G x = G0 x | G1 x (G x) f(x) = x + f(g(x)) g(x) = x + xg(x)
```

data F x = F0 x | F1 (F (G x)) data G x = G0 x | G1 x (G x) 
$$f(x) = x + f(g(x))$$
 
$$g(x) = x + xg(x)$$

$$f(x) = x + f(\frac{x}{1 - x})$$

$$f(x) = x + f(g(x))$$
$$g(x) = x + xg(x)$$

$$f(x) = x + f(\frac{x}{1 - x})$$

$$f(x) = \sum_{n=0}^{\infty} \frac{x}{1 - nx}$$

$$f(x) = x + f(g(x))$$
$$g(x) = x + xg(x)$$

$$f(x) = x + f(\frac{x}{1 - x})$$

$$f(x) = \sum_{n=0}^{\infty} \frac{x}{1 - nx}$$

$$f(x) = \psi(-\frac{1}{x}) + \gamma$$
 
$$\psi(x) = \frac{d}{dx} \ln \Gamma(x) = \frac{\Gamma'(x)}{\Gamma(x)}$$

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- ▶ And a value *a* : *A* of type *A* is interpreted as a proof of the corresponding proposition
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- ▶ The types  $A \oplus B$  and  $A \otimes B$  get interpreted as  $A \vee B$  and  $A \wedge B$

# The Rosetta Stone

Category Theory	Physics	Topology	Logic	Computation
object X	Hilbert space X	manifold X	proposition X	data type X
morphism	operator	cobordism	proof	program
$f: X \to Y$	$f: X \to Y$	$f: X \to Y$	$f: X \to Y$	$f: X \to Y$
tensor product	Hilbert space	disjoint union	conjunction	product
of objects:	of joint system:	of manifolds:	of propositions:	of data types:
$X \otimes Y$	$X \otimes Y$	$X \otimes Y$	$X \otimes Y$	$X \otimes Y$

# The Rosetta Stone: Homotopy Type Theory style

Types	Logic	Sets	Homotopy
A	proposition	set	space
a:A	proof	element	point
B(x)	predicate	family of sets	fibration
b(x):B(x)	conditional proof	family of elements	section
0,1	⊥,⊤	$\emptyset$ , $\{\emptyset\}$	Ø,*
A + B	$A \vee B$	disjoint union	coproduct
$A \times B$	$A \wedge B$	set of pairs	product space
$A \rightarrow B$	$A \Rightarrow B$	set of functions	function space
$\sum_{(x:A)} B(x)$	$\exists_{x:A}B(x)$	disjoint sum	total space
$\prod_{(x:A)} B(x)$	$\forall_{x:A}B(x)$	product	space of sections
$\operatorname{Id}_{A}$	equality =	$\{ (x,x) \mid x \in A \}$	path space $A^I$

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- ▶ In simply typed  $\lambda$ -calculus values and types are separate
- In Haskell's core language, for example, values and types get mapped to two separate data structures: data Expr and data Type respectively
- ▶ In dependently typed languages those two are unified
- ► The core language consist of a single data structure: data Expr that represents both values and types

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- ▶  $\prod_{a:A} B(a)$  is analogous to the  $\forall$  quantifier  $\forall a: A, B(a)$  in logic
- ▶  $\sum_{a:A} B(a)$  is analogous to the  $\exists$  quantifier  $\exists a: A, B(a)$  in logic

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- ▶  $\sum_{a:A} B(a)$  is analogous to the  $\exists$  quantifier  $\exists a: A, B(a)$  in logic
- ▶ The last ingredient is the equality type  $Id_A : A \rightarrow A \rightarrow Type$  populated by proofs  $a =_A b : Id_A(a, b)$

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$$\prod_{a:\mathbb{N}}\prod_{b:\mathbb{N}}(a\leq b\to \sum_{n:\mathbb{N}}a+n=_{\mathbb{N}}b)$$

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$$\prod_{a:\mathbb{N}}\prod_{b:\mathbb{N}}(a\leq b\to \sum_{n:\mathbb{N}}a+n=_{\mathbb{N}}b)$$

$$\mathit{Iso}(A, B : \mathit{Type}) := \sum_{f: A \rightarrow B} \sum_{g: B \rightarrow A} (\prod_{a: A} g(\mathit{f}(a)) =_A a) \otimes (\prod_{b: B} \mathit{f}(g(b)) =_B b)$$

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#### A taste of Lean

```
theorem prod_commutative (p q : Type) : p × q → q × p := \lambda hpq : p × q, prod.mk (prod.snd hpq) (prod.fst hpq) theorem prod_commutative2 (p q : Type) : p × q → q × p := assume hpq : p × q, have hp : p, from prod.fst hpq, have hq : q, from prod.snd hpq, show q × p, from prod.mk hq hp theorem mul_cancel_left_or {a b c : \mathbb{Z}} (H : a * b = a * c) : a = 0 \vee b = c := have H2 : a * (b - c) = 0, by simp, have H3 : a = 0 \vee b - c = 0, from mul_eq_zero H2, or.imp_or_right H3 (assume H4 : b - c = 0, sub_eq_zero H4)
```

#### Set theory Lean

```
def set (\alpha: \mathsf{Type}) := \alpha \to \mathsf{Prop} def mem (a:\alpha) (s: \mathsf{set}\ \alpha) := \mathsf{s}\ \mathsf{a} def union (s_1\ s_2: \mathsf{set}\ \alpha) : \mathsf{set}\ \alpha := \{\mathsf{a}\ |\ \mathsf{a} \in s_1 \lor \mathsf{a} \in s_2\} def image (\mathsf{f}:\alpha \to \beta) (\mathsf{s}: \mathsf{set}\ \alpha) : \mathsf{set}\ \beta := \{\mathsf{b}\ |\ \exists\ \mathsf{a},\ \mathsf{a} \in \mathsf{s} \land \mathsf{f}\ \mathsf{a} = \mathsf{b}\}
```

#### Further reading

- "Analytic Combinatorics" by Philippe Flajolet and Robert Sedgewick
- "Physics, Topology, Logic and Computation: A Rosetta Stone" by John Baez and Mike Stay
- "Homotopy Type Theory: Univalent Foundations of Mathematics" by The Univalent Foundations Program
- "Proofs and Types" by Jean-Yves Girard
- "Constructive Mathematics and Computer Programming" by Per Martin-Löf
- "Tutorial: Theorem Proving in Lean" https://leanprover.github.io/tutorial/

# Questions?