

# Functional programming concepts

## Everything is a function

Johan Eikelboom

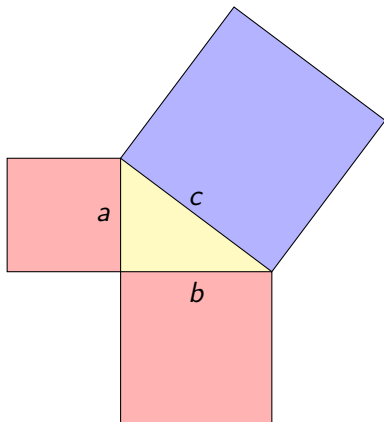
VXCompany

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# Overview

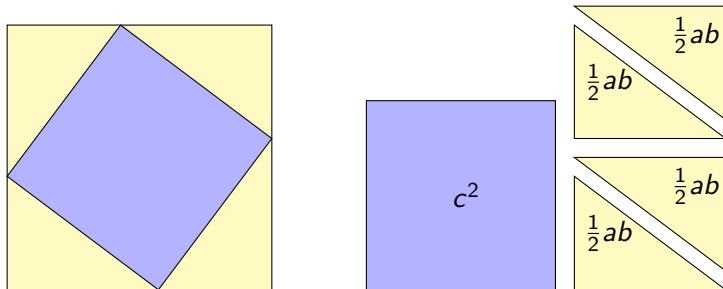
- Mathematical reasoning and programming
- Paradigms, Functions, High order functions.
- Advanced concepts: Functors and Monads
- Not: programming language syntax

# Pythagoras



$$a^2 + b^2 = c^2$$

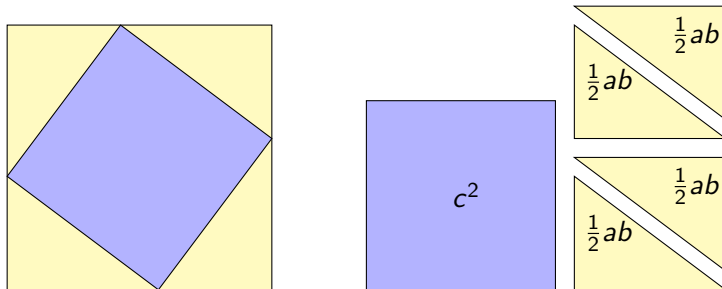
# A proof for Pythagoras



$\longleftrightarrow a + b \longrightarrow$

$$(a + b)^2 = c^2 + 4 \times \frac{1}{2}ab$$

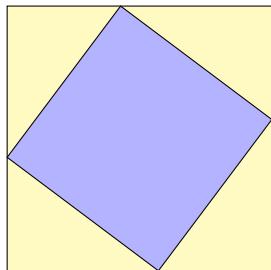
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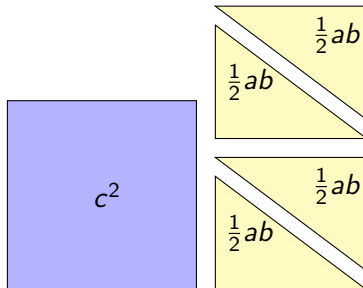
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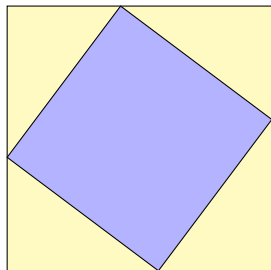


$\longleftrightarrow a + b \longrightarrow$

$$(a + b)^2 = c^2 + 2ab$$

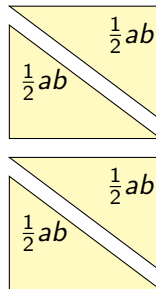
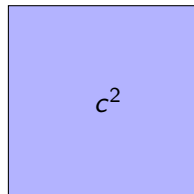


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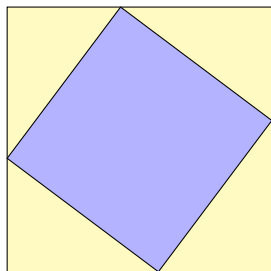


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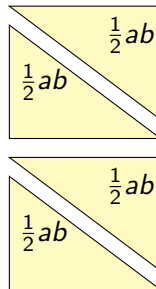
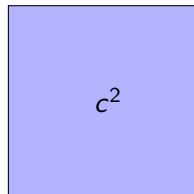


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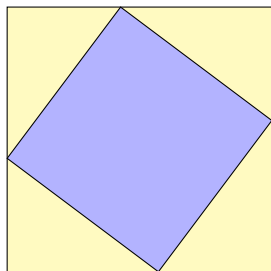
$\longleftrightarrow a + b \longrightarrow$

$$a^2 + 2ab + b^2 = c^2 + 2ab$$



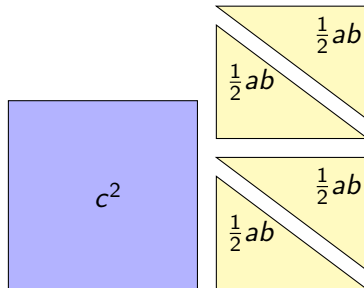


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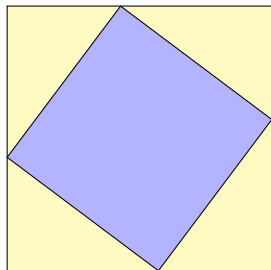


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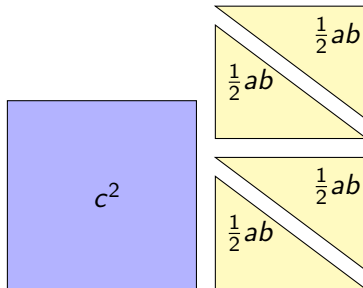


# A proof for Pythagoras



$\longleftrightarrow a + b \longrightarrow$

$$a^2 + b^2 = c^2$$



# What happened?

- 1 We had a problem in geometry (proof of Pythagoras).
- 2 We used algebra to solve it and to reason about it.

OK

- But we are programmers.
- Can we also do that with programs?

# Greatest common divisor

A function to calculate the greatest common divisor.

```
fun gcd(a: Int, b: Int): Int = if (b==0) a else gcd(b, a % b)
```

See if it works:

The greatest common divisor of 18 and 42 is 6.

$\text{gcd}(18, 42) = \text{if } (42 == 0) \text{ } 18 \text{ else } \text{gcd}(42, 18 \% 42)$

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gcd(18, 42) = if (true) 6 else gcd(0, 6 % 0)
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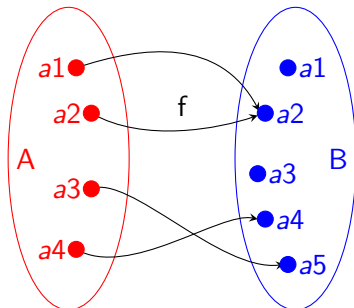
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This is called: equational reasoning

# What is a function



A function  $f : A \rightarrow B$  maps all elements from set A to B.  
The homset  $B^A$  is the set of all functions from A to B.

# Functional programming vs imperative programming

## Functional

- Declarative  
Expression evaluation
- Immutable
- No side effects
- Equational reasoning
- Functions are "first class"

## Imperative

- Instructions  
Sequence, selection, iteration, goto
- Mutable data and variables
- Side effects

# Side effects

Any other effect besides returning a value:

- Heating the CPU
- Execution delays
- Accessing global data
- Modification of input arguments
- Synchronisation
- IO operations
- Getting the time
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Side-effects make analysing and reasoning more difficult.  
Pure functional programs are completely useless.



# Functional vs object orientation? The Expression problem

Phil Wadler formulated the expression problem

Given:

- A tree like structure representing an expression.
- One operator is supported: plus
- One operation is supported: evaluate

Then add one operator (minus) and one operation (prettyprint),  
without changing the existing code

# First class functions

- Functions are first class citizens : functions can be used as argument or return value in function calls.
- Higher order functions: functions that accept other functions as argument or return value.
- Referential transparency. Client is not aware if he refers to a value or a function.

# High order functions examples

- Java streams and Kotlin collections use predicates
- Dependency inversion, or callback mechanisms
- Abstraction of control structures. (file handling)

```
val mylist = listOf("The", "quick", "brown", "fox")  
val lengths = mylist.map { s -> s.length }  
val size = mylist.fold(0, {total, value -> total + 1})
```

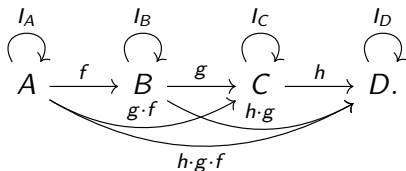
fold is the mother of all aggregations

## Functions as a result: Currying

- Functions with multiple arguments can be curried.
- Uncurried:  $f : (a : A, b : B) \rightarrow C$
- Curried becomes  $f : A \rightarrow B \rightarrow C$
- Read this as  $f : A \rightarrow (B \rightarrow C)$

```
val add: (Int, Int) -> Int = {x, y -> x + y}  
val addCurried: (Int) -> (Int) -> Int = add.curried()  
val incr = addCurried(1)  
val six = incr(5)
```

# Category theory



A category has:

- objects, such as  $A$ ,  $B$ ,  $C$  and  $D$
- arrows between objects, such as  $f: A \rightarrow B$  and  $g: B \rightarrow C$
- arrow composition:  $g \cdot f: A \rightarrow C$
- associativity:  $h \cdot (g \cdot f) = (h \cdot g) \cdot f$
- identity arrows for each object:  $f \cdot I_A = I_B \cdot f = f$
- N.B. Identity and composed arrows are typically not drawn.

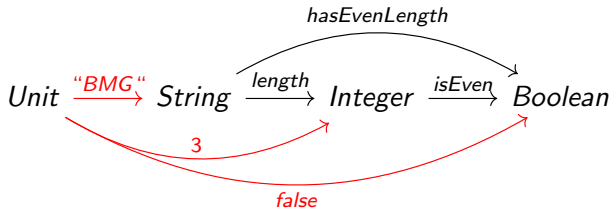
## Category theory usage

Categories can model many concepts, e.g. subsets, logical implications, morphisms, and more.

Here we will only use it as a modelling tool for functions and types:

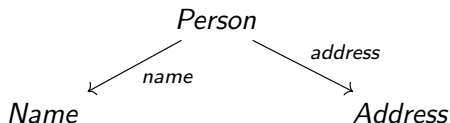
$$A \xrightarrow{f} B$$

## Concrete example with functions and sets



- *Unit* is a set with 1 element
- Values can be considered function from unit to another set:  
"BMG", 3 and false are (constant) functions
- This diagram commutes: every path between objects is equal.
- Thus  $length \cdot BMG = 3$  and  $isEven \cdot 3 = false$

# Product type

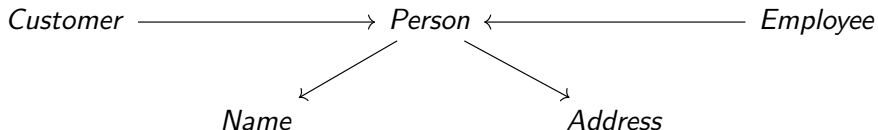


Kotlin data classes can be used as product types.

We call the functions projections.



# Sum type

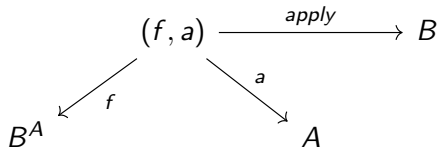


Reversing the arrows of product type gives a sum type.

A person can be a customer or an employee.

Kotlin implementations is possible with inheritance or delegation.

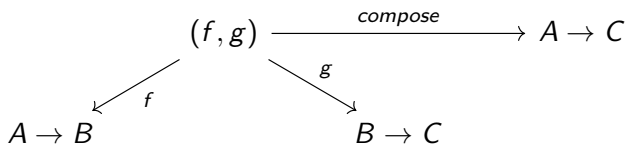
# Function application



If we have a function from the homset  $B^A$  and an argument we can apply the function to obtain an element of  $B$ .

$$\text{apply}(f, a) = f(a)$$

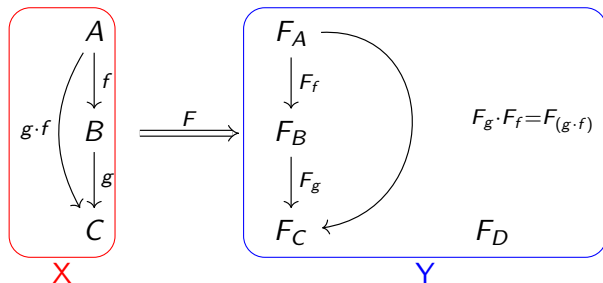
# Function composition



We have a functions  $A \rightarrow B$  and  $B \rightarrow C$ . These can be composed to form a function  $A \rightarrow C$ .

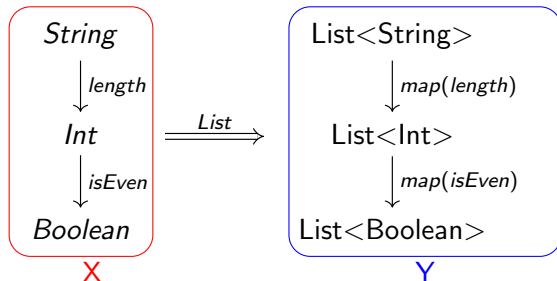
$$\text{compose}(f, g) = \{x \rightarrow g(f(x))\}$$

# Functor



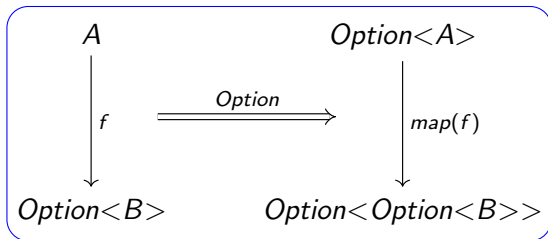
- A functor is an arrow that maps one category to another category
- A functor preserves the structure.
- Functors can be composed, and Identity functors exist.
- Thus this a category of categories.

## Functor example: List



- In Kotlin/Java, Functors are implemented as generics.
- Think of it as a function in the type system.
- List (Stream) and map create the Functor.

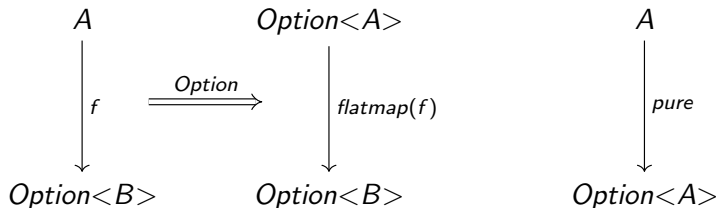
# EndoFunctor



## Option

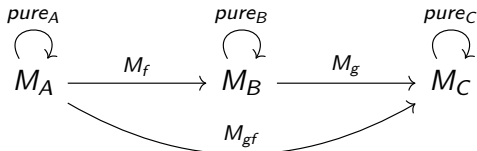
- An endofunctor is a functor inside one category.
- What if we map a function  $f : A \rightarrow Option<B>$ ?
- Can we get  $Option<Option<B>>$  flattened?

# Monad and flatmap



- A monad is a Functor, with a flatmap and pure added.
- Flatmap is the map, that “flattens” the output type.
- Function pure lifts a value into the monad.
- Functions typed  $f : (A) \rightarrow Option<B>$  are monadic functions.

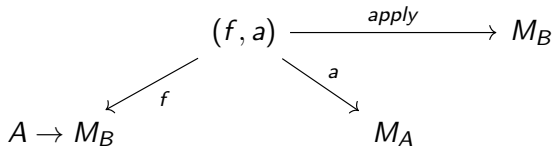
# Monad category picture



- Monadic types and functions turn out to form a similar category as regular functions.
- $pure_T$  is required to be the identity
- so:  $M_f = M_f \cdot pure_A = pure_B \cdot M_f$ .
- Monadic functions are regular functions with an extra “effect”.

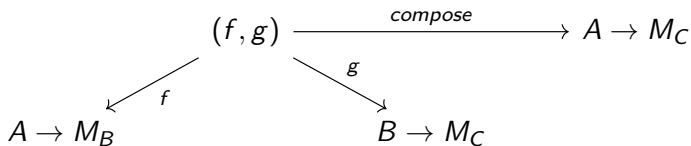


# Monad application



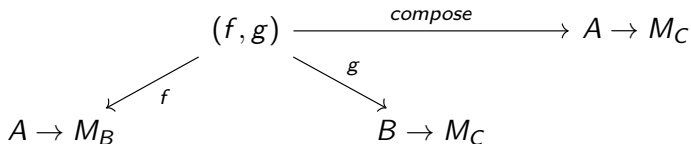
$$\text{apply}(f : A \rightarrow M_B, a : M_A) = a.\text{flatmap}(f)$$

# Monad composition



$$\begin{aligned}
 & \text{compose}(f : A \rightarrow M_B, f : B \rightarrow M_C) \\
 &= \{a \rightarrow f(a).\text{flatmap}(g)\} \\
 &= \{a \rightarrow f(a).\text{flatmap}\{b \rightarrow g(b)\}\}
 \end{aligned}$$

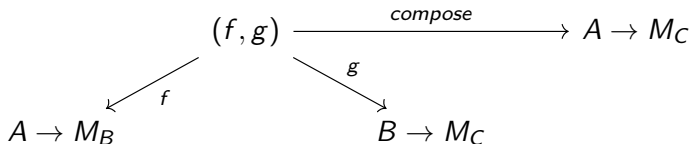
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So... flatmap is “just” a wrapper around a monadic function.

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So... flatmap is “just” a wrapper around a monadic function.  
“Just” like proxy objects, servlet filters, error aspects etc

# Monad examples

Monads encapsulate side-effects into effects:

- Data structures, containers (Tree, Set, List, Optional).
- Applicatives are a structure between monad and functor.  
e.g. Given a function  $f : A \rightarrow B \rightarrow C$  you can get  
 $M_f : M_A \rightarrow M_B \rightarrow M_C$   
for example to multiply timelines.
- Synchronization (Future, Promise, Actors).
- Exception and error handling (Try monad).
- State management. (reader, writer, state monad).

# Monad comprehensions

- Setbuilder

$range = \{1, 2, 3, \dots, 19, 20\}$   
 $\{a, b, c \in range \mid a < b \wedge a^2 + b^2 = c^2\}$

- SQL

select a.nr as a, b.nr as b, c.nr as c  
 from range a, range b, range c  
 where  $a.nr < b.nr$   
 and  $a.nr * a.nr + b.nr * b.nr = c.nr * c.nr$

- Kotlin

```
range.flatMap {
  a -> range.filter { b -> a < b }.flatMap {
    b -> range.filter { c -> a*a + b*b == c*c }.map {
      c -> Triple(a,b,c) }}}}
```

## Monad remarks

- Ten-thousands of blogs exist on monads.
- There is no good generic way to compose different monads, e.g. Futures of Optionals.
- Frameworks and libraries often avoid the term.
- Many other syntaxes and names are used.  
Bind,  $>>=$ ,  $>=>$ , pure, return, comprehensions with for or do expressions and even Kotlin's `?`-operator
- Frameworks: Arrows (Kotlin) ScalaZ and Cats.

# Overview

- Equational reasoning.
- Side-effects
- High Order functions
- Functor.
- Monad.



## Useful links

- fpConcepts
- Bartosz Milewski's blog (also on youtube and made a book)
- Richard Southwell vlog