# Category Theory by Example

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# **Notations**

```
[C, D] Fun category (Example 4.2)
\alpha \circ \beta Vertical composition of natural transformations (dot)
\alpha \star \beta Horizontal composition of natural transformations (circle dot)
\alpha H
        Left whiskering
        Natural transformation (Greek small letters)
\alpha: F \to G Natural transformation (arrow with dot)
\mathbf{C}_{\mathbf{M}}
        Kleisli category
\mathbf{C}
        Category (bold capital Latin letter)
\mathbf{C}^{op}
        Opposite category
cod f Codomain
dom f Domain
hom(a, b) set of Morphisms between a and b
hom_{\mathbf{C}}(a,b) Set of morphisms
\mathbf{1}_{\mathbf{C}\Rightarrow\mathbf{C}} Identity functor
\mathbf{1}_{a \to a} Identity morphism
\mathbf{1}_{F \xrightarrow{} F} Identity natural transformation
\langle M, \mu, \eta \rangle Monad
        finite dimensional Hilbert space
a \cong_f b there is an Isomorphism f between a and b
```

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```
a,b Objects (Latin small letters)
F \circ G \text{ Functor composition (circle dot)}
f \circ g \text{ Morphism composition (circle dot)}
F,G \text{ Functor (capital Latin letter)}
f,g,h \text{ Morphism (Latin small letter)}
F: \mathbf{C} \Rightarrow \mathbf{D} \text{ Functor (double arrow)}
f: a \rightarrow b \text{ Morphism (simple arrow)}
H\alpha \text{ Right whiskering}
```

TBD To Be Defined (later)

# Introduction

You just looked at yet another introduction to Category Theory. The subject mostly consists of a lot of definitions that are related each others and I wrote the book to collect all of them in one place to be easy checked and updated in future when I decide to refresh my knowledge about the field of math. Therefore the book was written mostly for my category theory studying purposes but I will appreciate if somebody else find it useful.

The topics(chapters) cover the base definitions (Object, Morphism and Category), Functor, Natural transformation, Monad and also include important results from the category theory such as Yoneda's lemma and Curry-Howard-Lambek correspondence.

There are a lot of examples in each chapter. The examples cover different category theory application areas. I assume that the reader is familiar with the corresponding area and the example(s) can be passed if not. I.e. anyone can choose the suitable example(s) for (s)he.

The most important examples are related to the set theory. The set theory and category theory are very close related. Each one can be considered as an alternative view to another one.

There are a lot of examples from programming languages which include Haskell, Scala, C++. The source files for programming languages examples (Haskell, C++, Scala) can be found on github repository [6].

The examples from physics are related to quantum mechanics that is the most known for me. For the examples I am inspired by the Bob Coecke article [1].

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# Chapter 1

# Base definitions

### 1.1 Definitions

## 1.1.1 Object

**Definition 1.1** (Class). A class is a collection of sets (or sometimes other mathematical objects) that can be unambiguously defined by a property that all its members share.

**Definition 1.2** (Object). In category theory object is considered as something that does not have internal structure (aka point) but has a property that makes different objects belong to the same Class

**Remark 1.3** (Class of Objects). The Class of Objects will be marked as ob(C) (see fig. 1.1).



Figure 1.1: Class of objects  $\operatorname{ob}(\mathbf{C}) = \{a,b,c,d\}$ 

### 1.1.2 Morphism

Morphism is a kind of relation between 2 Objects.

**Definition 1.4** (Morphism). A relation between two Objects a and b

$$f_{ab}:a\rightarrow b$$

is called morphism. Morphism assumes a direction i.e. one Object (a) is called source and another one (b) target.

The Set of all morphisms between objects a and b is denoted as hom (a, b).

**Definition 1.5** (Domain). Given a Morphism  $f: a \to b$ , the Object a is called domain and denoted as dom f.

**Definition 1.6** (Codomain). Given a Morphism  $f: a \to b$ , the Object b is called codomain and denoted as cod f.

Morphisms have several properties. <sup>1</sup>

**Axiom 1.7** (Composition). If we have 3 Objects a, b and c and 2 Morphisms

$$f_{ab}: a \to b$$

and

$$f_{bc}: b \to c$$

then there exists Morphism

$$f_{ac}: a \to c$$

such that

$$f_{ac} = f_{bc} \circ f_{ab}$$

Remark 1.8 (Composition). The equation

$$f_{ac} = f_{bc} \circ f_{ab}$$

means that we apply  $f_{ab}$  first and then we apply  $f_{bc}$  to the result of the application i.e. if our objects are sets and  $x \in a$  then

$$f_{ac}(x) = f_{bc}(f_{ab}(x)),$$

where  $f_{ab}(x) \in b$ .

<sup>&</sup>lt;sup>1</sup>The properties don't have any proof and postulated as axioms

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**Axiom 1.9** (Associativity). The Morphisms Composition (Axiom 1.7) s should follow associativity property:

$$f_{ce} \circ (f_{bc} \circ f_{ab}) = (f_{ce} \circ f_{bc}) \circ f_{ab} = f_{ce} \circ f_{bc} \circ f_{ab}.$$

**Definition 1.10** (Identity morphism). For every Object a we define a special Morphism  $\mathbf{1}_{a\to a}: a\to a$  with the following properties:  $\forall f_{ab}: a\to b$ 

$$\mathbf{1}_{a \to a} \circ f_{ab} = f_{ab} \tag{1.1}$$

and  $\forall f_{ba}: b \to a$ 

$$f_{ba} \circ \mathbf{1}_{a \to a} = f_{ba}. \tag{1.2}$$

This morphism is called as identity morphism.

Note that Identity morphism is unique, see Identity is unique (Theorem 2.3) below.

**Definition 1.11** (Commutative diagram). A commutative diagram is a diagram of Objects (also known as vertices) and Morphisms (also known as arrows or edges) such that all directed paths in the diagram with the same start and endpoint lead to the same result by composition

The following diagram commutes if  $f_{ab} = f_{cb} \circ f_{ac}$ .



**Remark 1.12** (Class of Morphisms). The Class of Morphisms will be marked as  $hom(\mathbf{C})$  (see fig. 1.2)

**Definition 1.13** (Monomorphism). If  $\forall g_1, g_2$  the equation

$$f \circ g_1 = f \circ g_2$$

leads to

$$g_1 = g_2$$

then f is called monomorphism.



Figure 1.2: Class of morphisms hom( $\mathbf{C}$ ) =  $\{f, g, h\}$ , where  $h = f \circ g$ 

**Definition 1.14** (Epimorphism). If  $\forall g_1, g_2$  the equation

$$g_1 \circ f = g_2 \circ f$$

leads to

$$g_1 = g_2$$

then f is called *epimorphism*.

**Definition 1.15** (Isomorphism). A Morphism  $f: a \to b$  is called *isomorphism* if  $\exists g: b \to a$  such that  $f \circ g = \mathbf{1}_{a \to a}$  and  $g \circ f = \mathbf{1}_{b \to b}$ . If there is an isomorphism f between objects a and b then it is denoted as  $a \cong_f b$ .

Remark 1.16 (Isomorphism). There are can be many different Isomorphisms between 2 Objects.

If there is an unique isomorphism between 2 objects then the objects can be treated as the same object.

### 1.1.3 Category

**Definition 1.17** (Category). A category C consists of

- Class of Objects ob(C)
- Class of Morphisms hom( $\mathbf{C}$ ) defined for ob( $\mathbf{C}$ ), i.e. each morphism  $f_{ab}$  from hom( $\mathbf{C}$ ) has both source a and target b from ob( $\mathbf{C}$ )

For any Object a there should be unique Identity morphism  $\mathbf{1}_{a\to a}$ . Any morphism should satisfy Composition (Axiom 1.7) and Associativity (Axiom 1.9). See fig. 1.3

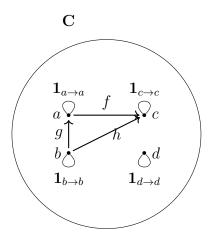


Figure 1.3: Category C. It consists of 4 objects  $ob(\mathbf{C}) = \{a, b, c, d\}$  and 7 morphisms  $ob(\mathbf{C}) = \{f, g, h = f \circ g, \mathbf{1}_{a \to a}, \mathbf{1}_{b \to b}, \mathbf{1}_{c \to c}, \mathbf{1}_{d \to d}\}$ 

**Definition 1.18** (Set of morphisms). The set of morphisms between objects a and b in the C will be denoted as  $hom_{C}(a, b)$ 

The Category can be considered as a way to represent a structured data. Morphisms are the ones which form the structure.

**Definition 1.19** (Opposite category). If **C** is a Category then opposite (or dual) category  $\mathbf{C}^{op}$  is constructed in the following way: Objects are the same, but the Morphisms are inverted i.e. if  $f \in \text{hom}(\mathbf{C})$  and dom f = a, cod f = b, then the corresponding morphism  $f^{op} \in \text{hom}(\mathbf{C}^{op})$  has dom  $f^{op} = b, \text{cod } f^{op} = a$  (see fig. 1.4)

**Remark 1.20.** Composition on  $C^{op}$  As you can see from fig. 1.4 the Composition (Axiom 1.7) is reverted for Opposite category. If  $f, g, h = f \circ g \in \text{hom}(\mathbf{C})$  then  $f \circ g$  translated into  $g^{op} \circ f^{op}$  in opposite category.

**Definition 1.21** (Small category). A category C is called *small* if both ob(C) and hom(C) are Sets

**Definition 1.22** (Large category). A category C is not Small category then it is called *large*. The example of large category is **Set** category

### 1.2 Examples

There are several examples of categories that will also be used later



Figure 1.4: Opposite category  $C^{op}$  to the category from fig. 1.3. It consists of 4 objects  $ob(\mathbf{C^{op}}) = ob(\mathbf{C}) = \{a, b, c, d\}$  and 7 morphisms  $hom(\mathbf{C^{op}}) = \{f^{op}, g^{op}, h^{op} = g^{op} \circ f^{op}, \mathbf{1}_{a \to a}, \mathbf{1}_{b \to b}, \mathbf{1}_{c \to c}, \mathbf{1}_{d \to d}\}$ 

### 1.2.1 Set category

**Definition 1.23** (Set). Set is a collection of distinct object. The objects are called the elements of the set.

**Definition 1.24** (Binary relation). If A and B are 2 Sets then a subset of  $A \times B$  is called binary relation R between the 2 sets, i.e.  $R \subset A \times B$ .

**Definition 1.25** (Function). Function f is a special type of Binary relation. I.e. if A and B are 2 Sets then a subset of  $A \times B$  is called function f between the 2 sets if  $\forall a \in A \exists ! b \in B$  such that  $(a, b) \in f$ . In other words function definition does not allow "multi value".

**Definition 1.26** (Set category). In the set category we consider a Set of Sets where Objects are the Sets and Morphisms are Functions between the sets.

The Identity morphism is trivial function such that  $\forall x \in X : \mathbf{1}_{X \to X}(x) = x$ .

In general case when we say **Set** category we assume the set of all sets. But the result is inconsistent because famous Russell's paradox [12] can be applied. To avoid such situations we consider a limitation that is applied on our construction, for instance ZFC [13]. If we apply the limitation we have that set of all sets is not a set itself and as result the **Set** category is a Large category



Figure 1.5: A surjective (non-injective) function from domain X to codomain Y

Remark 1.27 (Set vs Category). There is an interesting relation between sets and categories. In both we consider objects(sets) and relations between them(morphisms/functions).

In the set theory we can get info about functions by looking inside the objects(sets) aka use "microscope" [4]

Contrary in the category theory we initially don't have any info about object internal structure but can get it using the relation between the objects i.e. using Morphisms. In other words we can use "telescope" [4] there.

**Definition 1.28** (Singleton). The *singleton* is a Set with only one element.

**Example 1.29** (Domain). Given a function  $f: X \to Y$ , the set X is the domain. I.e. dom f = X

**Example 1.30** (Codomain). Given a function  $f: X \to Y$ , the set Y is the codomain. I.e.  $\operatorname{cod} f = Y$ 

**Definition 1.31** (Surjection). The function  $f: X \to Y$  is surjective (or onto) if  $\forall y \in Y, \exists x \in X \text{ such that } f(x) = y \text{ (see figs. 1.5 and 1.9)}.$ 

Remark 1.32 (Surjection vs Epimorphism). Surjection and Epimorphism are related each other. Consider a non-surjective function  $f: X \to Y' \subset Y$  (see fig. 1.6). One can conclude that there is not an Epimorphism because  $\exists g_1: Y' \to Y'$  and  $g_2: Y \to Y$  such that  $g_1 \neq g_2$  because they operates on different Domains but from other hand  $g_1(Y') = g_2(Y')$ . For instance we can choose  $g_1 = \mathbf{1}_{Y' \to Y'}, g_2 = \mathbf{1}_{Y \to Y}$ . As soon as Y' is Codomain of f we always have  $g_1(f(X)) = g_2(F(X))$ .

As result we can say that an Surjection is a Epimorphism in the **Set** category. Moreover there is a proof [10] of that fact.

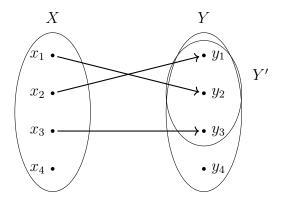


Figure 1.6: A non-surjective function f from domain X to codomain  $Y' \subset Y$ .  $\exists g_1: Y' \to Y', g_2: Y \to Y$  such that  $g_1(Y') = g_2(Y')$ , but as soon as  $Y' \neq Y$  we have  $g_1 \neq g_2$ . Using the fact that Y' is codomain of f we got  $g_1 \circ f = g_2 \circ f$ . I.e. the function f is not epimorphism.

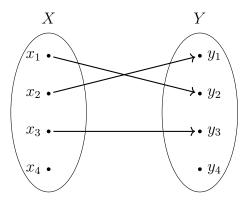


Figure 1.7: A injective (non-surjective) function from domain X to codomain Y

**Definition 1.33** (Injection). The function  $f: X \to Y$  is injective (or one-to-one function) if  $\forall x_1, x_2 \in X$ , such that  $x_1 \neq x_2$  then  $f(x_1) \neq f(x_2)$  (see figs. 1.7 and 1.9).

**Remark 1.34** (Injection vs Monomorphism). Injection and Monomorphism are related each other. Consider a non-injective function  $f: X \to Y$  (see fig. 1.8). One can conclude that it is not monomorphism because  $\exists g_1, g_2$  such that  $g_1 \neq g_2$  and  $f(g_1(a_1)) = g_3 = f(g_2(b_1))$ .

As result we can say that an Injection is a Monomorphism in **Set** category. Moreover there is a proof [9] of that fact.

**Definition 1.35** (Bijection). The function  $f: X \to Y$  is bijective (or one-to-one correspondence) if it is an Injection and a Surjection (see fig. 1.9).

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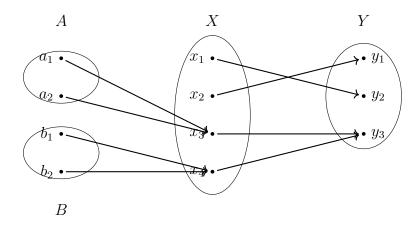


Figure 1.8: A non-injective function f from domain X to codomain Y.  $\exists g_1: A \to X, g_2: B \to X$  such that  $g_1 \neq g_2$  but  $f \circ g_1 = f \circ g_2$ . I.e. the function f is not monomorphism.

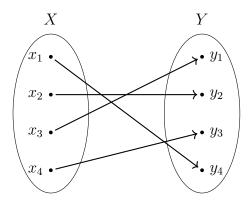


Figure 1.9: An injective and surjective function (bijection)

There is a question what is the categorical analog of a single Set. Main characteristic of a category is a structure but the set by definition does not have a structure. Which category does not have any structure? The answer is Discrete category.

**Definition 1.36** (Discrete category). Discrete category is a Category where Morphisms are only Identity morphisms.

### 1.2.2 Programming languages

In the programming languages we consider types as Objects and functions as Morphisms. The critical requirements for such consideration is that the functions have to be pure functions (without side effects). This requirement mainly is satisfied by functional languages such as Haskell and Scala. From other side the functional languages use lazy evaluation to improve their performance. The laziness can also make category theory axiom invalid (see Haskell lazy evaluation (Remark 1.42)).

Strictly speaking neither Haskell (pure functional language) nor C++ can be considered as a category in general. For the first approximation a functional language (Haskell, Scala) can be considered as a category if we avoid to use functions with side effects (mainly for Scala) and use strict (for both Haskell and Scala) evaluations. Take the fact into consideration and define categories for 3 languages

**Definition 1.37** (Hask category). The objects in the Hask category are Haskell types and morphisms are functions

**Definition 1.38** (Pure function). The function is pure if it's execution give the same results independently from the environment.

**Definition 1.39** (Scala category). The objects in the Scala category are Scala types and morphisms are functions. We don't define functions that have a state in the category. I.e. the functions are Pure functions.

**Definition 1.40** (C++ category). The objects in the C++ category are Scala types and morphisms are functions. We don't define functions that have a state in the category. I.e. the functions are Pure functions.

In any case we can construct a simple toy category that can be easy implemented in any language. Particularly we will look into category with 3 objects that are types: Int, Bool, String. There are also several functions between them (see fig. 1.10).

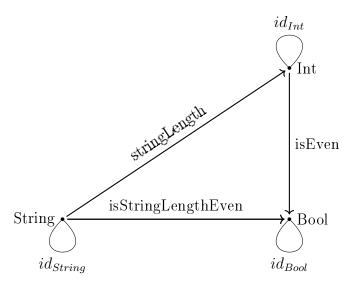


Figure 1.10: Programming language category example. Objects are types: Int, Bool, String. Morphisms are several functions

#### Hask toy category

**Example 1.41** (Hask toy category). Types in Haskell are considered as Objects. Functions are considered as Morphisms. We are going to implement Category from fig. 1.10.

The function is Even converts Int type into Bool.

```
isEven :: Int -> Bool
isEven x = x `mod` 2 == 0
```

There is also Identity morphism that is defined as follows

```
id :: a -> a
id x = x
```

If we have an additional function

```
stringLength :: String -> Int
stringLength x = length x
```

then we can create a Composition (Axiom 1.7)

```
isStringLengthEven :: String -> Bool
isStringLengthEven = isEven . stringLength
```

Remark 1.42 (Haskell lazy evaluation). Each Haskell type has a special value  $\perp$ . The fact that the value and lazy evaluations are part of the language, make several category law invalid, for instance Identity morphism behaviour become invalid in specific cases:

The following code

```
seq undefined True
```

produces undefined But the following

```
seq (id.undefined) True
seq (undefined.id) True
```

produces *True* in both cases. As result we have (we cannot compare functions in Haskell, but if we could we can get the following)

```
id . undefined /= undefined undefined . id /= undefined,
i.e. (1.1) and (1.2) are not satisfied.
```

#### C++ toy category

**Example 1.43** (C++ toy category). We will use the same trick as in **Hask** toy category (Example 1.41) and will assume types in C++ as Objects, functions as Morphisms. We also are going to implement Category from fig. 1.10.

We also define 2 functions:

```
auto isEven = [](int x) {
  return x % 2 == 0;
};
auto stringLength = [](std::string s) {
  return static_cast<int>(s.size());
};
```

Composition can be defined as follows:

```
// h = g . f
template <typename A, typename B>
auto compose(A g, B f) {
  auto h = [f, g](auto a) {
   auto b = f(a);
```

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```
auto c = g(b);
  return c;
};
return h;
};

The Identity morphism:
auto id = [](auto x) { return x; };

The usage examples are the following:
auto isStringLengthEven = compose<>(isEven, stringLength);
auto isStringLengthEvenL = compose<>(id, isStringLengthEven);
auto isStringLengthEvenR = compose<>(isStringLengthEven, id);
```

Such construction will always provides us the category as soon as we use pure function (functions without effects).

#### Scala toy category

**Example 1.44** (Scala toy category). We will use the same trick as in **Hask** toy category (Example 1.41) and will assume types in Scala as Objects, functions as Morphisms. We also are going to implement Category from fig. 1.10.

```
object Category {
  def id[A]: A => A = a => a
  def compose[A, B, C](g: B => C, f: A => B):
       A => C = g compose f

  val isEven = (i: Int) => i % 2 == 0
  val stringLength = (s: String) => s.length
  val isStringLengthEven = (s: String) =>
       compose(isEven, stringLength)(s)
}

The usage example is below

class CategorySpec extends Properties("Category") {
  import Category._
  import Prop.forAll
```

```
property("composition") = forAll { (s: String) =>
   isStringLengthEven(s) == isEven(stringLength(s))
}

property("right id") = forAll { (i: Int) =>
   isEven(i) == compose(isEven, id[Int])(i)
}

property("left id") = forAll { (i: Int) =>
   isEven(i) == compose(id[Boolean], isEven)(i)
}
```

#### 1.2.3 Quantum mechanics

The most critical property of quantum system is the superposition principle. The **Set** category cannot be used for it because it does not satisfied the principle. but a simple modification of the **Set** category does.

**Definition 1.45** (Rel category). We will consider a set of sets (same as **Set** category) i.e. Sets as Objects. Instead of Functions we will use Binary relations as Morphisms.

The **Rel** category is similar to the finite dimensional Hilber space especially because it assumes some kind of superposition. Really consider **Rel** - the **Rel** category.  $X, Y \in \text{ob}(\mathbf{Rel})$  - 2 sets which consists of different elements. Let  $f: X \to X$  - Morphism. Each element  $x \in X$  is mapped to a subset  $Y' \subset Y$ . The Y' can be Singleton (in this case no differences with **Set** category) but there can be a situation when Y' consists of several elements. In the case we will get some kind of superposition that is analogiest to quantum systems.

In the quantum mechanics we say about Hilber spaces.

**Definition 1.46** (Hilbert space). The Hilbert space is a complex vector space with an inner product as a complex number  $(\mathbb{C})$ .

Later we will consider only finite dimensional Hilber spaces. We will denote a Hilber space of dimensional n as  $\mathcal{H}_n$ . Obviously  $\mathcal{H}_1 = \mathbb{C}$ .

**Definition 1.47** (Dual space). Each Hilber space  $\mathcal{H}$  has an associated with it dual space  $\mathcal{H}^*$  that consists of linear functionals

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**Example 1.48** (Dirac notation). Consider a ket-vector  $|\psi\rangle \in \mathcal{H}$ . Then the corresponding vector from Dual space is called bra-vector  $\langle \psi | \in \mathcal{H}^*$ . From the definition of dual space the bra-vector is a linear functional i.e.

$$\langle \psi | : \mathcal{H} \to \mathbb{C},$$

 $\forall |\phi\rangle \in \mathcal{H}$  we have  $\langle \psi | (|\phi\rangle) = (|\psi\rangle, |\phi\rangle)$  - inner product that is often written as  $\langle \psi | \phi \rangle$ .

The transformation between 2 Hilbert spaces that preserves the structure is called linear map or linear transformations.

**Definition 1.49** (Linear map). The linear map between Hilbert spaces  $\mathcal{A}$  and  $\mathcal{B}$  is a mapping  $f: \mathcal{A} \to \mathcal{B}$  that preserves additions

$$f(a_1 + a_2) = f(a_1) + f(a_2),$$

and scalar multiplications:

$$f(c \cdot a) = c \cdot f(a)$$

where  $a, a_{1,2} \in \mathcal{A}$  and  $f(a), f(a_{1,2}) \in \mathcal{B}$ .

Remark 1.50 (Linear map). Note that Linear map does not preserve inner product. TBD (verify the statement ???)

If we want to combine 2 Hilbert spaces into one we use a notion of direct sum.

**Definition 1.51** (Direct sum of Hilber spaces). Let  $\mathcal{A}, \mathcal{B}$  are 2 Hilber spaces. The direct sum  $\mathcal{A} \oplus \mathcal{B}$  is defined as follows

$$\mathcal{A} \oplus \mathcal{B} = \{ a \oplus b | a \in \mathcal{A}, b \in \mathcal{B} \}.$$

The inner product is defined as follows

$$\langle a_1 \oplus b_1 | a_2 \oplus b_2 \rangle = \langle a_1 | a_2 \rangle + \langle b_1 | b_2 \rangle.$$

**Definition 1.52** (FdHilb category). Most common case in quantum mechanics is the case of quantum states in the finite dimensional Hilbert space. We can consider the set of all finite dimensional Hilbert spaces as a category. The Objects in the category are finite dimensional Hilbert spaces and Morphisms are Linear maps. The category is denoted as FdHilb. It is very similar to Rel category. The brief relation is described in the table 1.1.

	Set	Rel	FdHilb
Object	Set	Set	finite dimensional Hilbert space
Morphism	Function	Binary relation	Linear map
Initial object	empty set	empty set	trivial Hilbert space of dimensional 0
Terminal object	Singleton	Singleton	$\mathbb{C}$
Product	Cartesian product	Cartesian product	Direct sum of Hilber spaces
Sum	Sum (Example 2.15)	Sum (Example 2.15)	Direct sum of Hilber spaces

Table 1.1: Relations between **Set**, **Rel** and **FdHilb** categories

**Example 1.53** (Rabi oscillations). For our example we consider a 2 level atom with states  $|a\rangle$  - excited and  $|b\rangle$  - ground. As soon as we consider a 2-level system we are in the 2 dimensional Hilbert space i.e. have only one Object. Lets call it as  $|\psi\rangle$ . The category in the example will be called as **Rabi**. I.e. ob(**Rabi**) =  $\mathcal{H}_2\{|\psi\rangle\}$ .

The atom interacts with light beam of frequency  $\omega = \omega_{ab}$ . The state of the system is described by the following equation [14]:

$$|\psi\rangle = \cos\frac{\omega_R t}{2} |a\rangle - i \sin\frac{\omega_R t}{2} |b\rangle$$
,

where  $\omega_R$  - Rabi frequency [14].

The interaction time t is fixed and corresponds to  $\omega_R t = \pi$  i.e. the interaction can be described a linear operator  $\hat{L}$ .

There are 4 different states and as result 4 Morphisms:

$$\begin{split} |\psi\rangle_0 &= |a\rangle\,,\\ |\psi\rangle_1 &= \hat{L}\,|\psi\rangle_0 = -i\,|b\rangle\,,\\ |\psi\rangle_2 &= \hat{L}^2\,|\psi\rangle_0 = -\,|a\rangle\,,\\ |\psi\rangle_3 &= \hat{L}^3\,|\psi\rangle_0 = i\,|b\rangle\,, \end{split}$$



Figure 1.11: Rabi oscillations as a category  ${f Rabi}$ 

# Chapter 2

# Objects and morphisms

### 2.1 Equality

The important question is how can we decide whenever an object/morphism is equal to another object/morphism? The trivial answer is possible if an Object is a Set. In the case we can say that 2 objects are equal if they contain the equivalent collection of elements. Unfortunately we cannot do the same trick for categorical Objects as soon as they don't have any internal structure but can use a similar approach as in Set vs Category (Remark 1.27): if we cannot use "microscope" lets use "telescope" and define the equality of objects and morphisms of a category  $\mathbb{C}$  in the terms of whole hom( $\mathbb{C}$ ).

**Definition 2.1** (Objects equality). Two Objects a and b in Category C are equal if there exists an unique Isomorphism  $a \cong_f b$ . This also means that also exist unique isomorphism  $b \cong_g a$ . These two Morphisms (f and g) are related each other via the following equations:  $f \circ g = \mathbf{1}_{a \to a}$  and  $g \circ f = \mathbf{1}_{b \to b}$ .

Unlike Functions between Sets we don't have any additional info <sup>1</sup> about Morphisms except category theory axioms which the morphisms satisfy [2]. This leads us to the following definition of morphims equality:

**Definition 2.2** (Morphisms equality). Two Morphisms f and g in Category  $\mathbf{C}$  are equal if the equality can be derived from the base axioms:

- Composition (Axiom 1.7)
- Associativity (Axiom 1.9)
- Identity morphism: (1.1), (1.2)

<sup>&</sup>lt;sup>1</sup> for instance info about sets internals. i.e. which elements of the sets are connected by the considered functions

or Commutative diagrams which postulate the equality.

As an example lets proof the following theorem

**Theorem 2.3** (Identity is unique). The Identity morphism is unique.

*Proof.* Consider an Object a and it's Identity morphism  $\mathbf{1}_{a\to a}$ . Let  $\exists f: a\to a$  such that f is also identity. In the case (1.1) for f as identity gives

$$f \circ \mathbf{1}_{a \to a} = \mathbf{1}_{a \to a}$$
.

From other side (1.2) for  $\mathbf{1}_{a\to a}$  satisfied

$$f \circ \mathbf{1}_{a \to a} = f$$

i.e.

$$f = f \circ \mathbf{1}_{a \to a} = \mathbf{1}_{a \to a}$$

or  $f = \mathbf{1}_{a \to a}$ .

### 2.2 Initial and terminal objects

**Definition 2.4** (Initial object). Let  $\mathbf{C}$  is a Category, the Object  $i \in \text{ob}(\mathbf{C})$  is called *initial object* if  $\forall x \in \text{ob}(\mathbf{C}) \exists ! f_x : i \to x \in \text{hom}(\mathbf{C})$ .

**Definition 2.5** (Terminal object). Let **C** is a Category, the Object  $t \in \text{ob}(\mathbf{C})$  is called *terminal object* if  $\forall x \in \text{ob}(\mathbf{C}) \exists ! g_x : x \to t \in \text{hom}(\mathbf{C})$ .

As you can see the initial and terminal objects are opposite each other. I.e. if i is an Initial object in  $\mathbf{C}$  then it will be Terminal object in the Opposite category  $\mathbf{C}^{op}$ .

**Theorem 2.6** (Initial object is unique). Let C is a category and  $i, i' \in ob(C)$  two Initial objects then there exists an unique Isomorphism  $u: i \to i'$  (see Objects equality)

Proof. Consider the following Commutative diagram (see fig. 2.1). As soon as i initial object  $\exists ! u : i \to i'$ . From other side i' is also initial object and therefore  $\exists ! u^{-1} : i' \to i$ . Combining them together via composition we can get  $u^{-1} \circ u : i \to i$  and  $u \circ u^{-1} : i' \to i'$ . From the fact that i is initial object one can get that there exists only one morphism  $\mathbf{1}_{i\to i} : i \to i$ . The same is the truth for i'. Therefore  $u^{-1} \circ u = \mathbf{1}_{i\to i}$  and  $u \circ u^{-1} = \mathbf{1}_{i'\to i'}$ . These complete the commutative diagram build and finishes the proof.



Figure 2.1: Commutative diagram for initial object uniqueness proof



Figure 2.2: Commutative diagram for terminal object uniqueness proof

**Theorem 2.7** (Terminal object is unique). Let C is a category and  $t, t' \in ob(C)$  two Terminal objects then there exists an unique Isomorphism  $v: t' \to t$  (see Objects equality)

*Proof.* Just got to the Opposite category and revert arrows in fig. 2.1. The result shown on fig. 2.2 and it proofs the theorem statement.  $\Box$ 

### 2.3 Product and sum

The pair of 2 objects is defined via the universal property in the following way:

**Definition 2.8** (Product). Let we have a category  $\mathbf{C}$  and  $c_1, c_2 \in \text{ob}(\mathbf{C})$  -two Objects then the product of the objects  $c_1, c_2$  is another object in  $\mathbf{C}$   $c = c_1 \times c_2$  with 2 Morphisms  $\pi_1, \pi_2$  such that  $c_1 = \pi_1(c), c_2 = \pi(c_2)$  and the following universal property is satisfied:  $\forall c' \in \text{ob}(\mathbf{C})$  and morphisms  $\pi'_1: c' \to c_1, \pi'_2: c' \to c_2$ , exists unique morphism h such that the following diagram (see fig. 2.3) commutes, i.e.  $\pi'_1 = \pi_1 \circ h, \pi'_2 = \pi_2 \circ h$ . In other words



Figure 2.3: Product  $c = c_1 \times c_2$ .  $\forall c, \exists ! h \in \text{hom}(\mathbf{C}) : \pi'_1 = \pi_1 \circ h, \pi'_2 = \pi_2 \circ h$ .

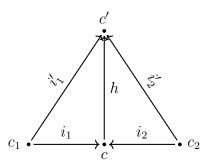


Figure 2.4: Sum  $c = c_1 \oplus c_2$ .  $\forall c, \exists ! h \in \text{hom}(\mathbf{C}) : i'_1 = h \circ i_1, i'_2 = h \circ i_2$ .

h factorizes  $\pi'_{1,2}$ .

If we invert arrows in Product we will got another object definition that is called sum

**Definition 2.9** (Sum). Let we have a category  $\mathbf{C}$  and  $c_1, c_2 \in \text{ob}(\mathbf{C})$  -two Objects then the sum of the objects  $c_1, c_2$  is another object in  $\mathbf{C}$   $c = c_1 \oplus c_2$  with 2 Morphisms  $i_1, i_2$  such that  $c = i_1(c_1), c = i_2(c_2)$  and the following universal property is satisfied:  $\forall c' \in \text{ob}(\mathbf{C})$  and morphisms  $i'_1 : c_1 \to c', i'_2 : c_2 \to c'$ , exists unique morphism h such that the following diagram (see fig. 2.4) commutes, i.e.  $i'_1 = h \circ i_1, i'_2 = h \circ i_2$ . In other words h factorizes  $i'_{1,2}$ .

### 2.4 Category as a monoid

Consider the following definition from abstract algebra

**Definition 2.10** (Monoid). The set of elements M with defined binary operation  $\circ$  we will call as a monoid if the following conditions are satisfied.

1. Closure:  $\forall a, b \in M$ :  $a \circ b \in M$ 

- 2. Associativity:  $\forall a, b, c \in M$ :  $a \circ (b \circ c) = (a \circ b) \circ c$
- 3. Identity element:  $\exists e \in M \text{ such that } \forall a \in M : e \circ a = a \circ e = a$

We can consider 2 Monoids. The first one has Product as the binary operation and Terminal object as the identity element. As result we just got an analog of multiplication in the category theory. This is why the terminal object is often denoted as 1 and the operation is called as the product.

Another one is additional Monoid that has Initial object as the identity element and the Sum as the binary operation. The initial object in that case is often denoted as **0**. I.e. we can see a direct connection with addition in algebra.

### 2.5 Exponential

**TBD** 

# 2.6 Programming languages and algebraic data types

**TBD** 

### 2.7 Examples

### 2.7.1 Set category

**Example 2.11** (Initial object). [Set] Note that there is only one function from empty set to any other sets [8] that makes the empty set as the Initial object in Set category.

**Example 2.12** (Terminal object). [Set] Terminal object in Set category is a set with one element i.e Singleton.

**Example 2.13** (Product). [Set] The Product of two sets A and B in Set category is defined as a Cartesian product:  $A \times B = \{(a,b) | a \in A, b \in B\}$ .

**Definition 2.14** (Disjoint union). Let  $\{A_i : i \in I\}$  be a family of sets indexed by I. The disjoint union [11] of this family is the set

$$\sqcup_{i\in I} A_i = \cup_{i\in I} \left\{ (x,i) : x \in A_i \right\}.$$

The elements of the disjoint union are ordered pairs (x, i). Here i serves as an auxiliary index that indicates which  $A_i$  the element x came from.

**Example 2.15** (Sum). [Set] The Sum of two sets A and B in Set category is defined as Disjoint union.

### 2.7.2 Programming languages

In our toy example fig. 1.10 the type String is Initial object and type Bool is the Terminal object. From other side there are types in different programming languages that satisfies the definitions of initial and terminal objects.

#### Hask category

**Example 2.16** (Initial object). [Hask] If we avoid lazy evaluations in Haskell (see Haskell lazy evaluation—(Remark 1.42)—) then we can found several types as candidates for initial and terminal object in Haskell. Initial object in Hask category is a type without values

```
data Void
```

i.e. you cannot construct a object of the type.

There is only one function from the initial object:

```
absurd :: Void -> a
```

The function is called absurd because it does absurd action. Nobody can proof that it does not exist. For the existence proof the following absurd argument can be used: "Just provide me an object type Void and I will provide you the result of evaluation".

There is no function in opposite direction because it would had been used for the Void object creation.

Example 2.17 (Terminal object). [Hask] Terminal object (unit) in Hask category keeps only one element

```
data() = ()
```

i.e. you can create only one element of the type. You can use the following function for the creation:

```
unit :: a -> ()
unit _ = ()
```

**Example 2.18** (Product). [Hask] The Product in Hask category keeps a pair and the constructor defined as follows

```
(,) :: a \rightarrow b \rightarrow (a, b)
(,) x y = (x, y)
```

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```
There are 2 projectors:
fst :: (a, b) -> a
fst(x, _) = x
snd :: (a, b) -> b
snd(_, y) = y
Example 2.19 (Sum). [Hask] The Sum in Hask category defined as
follows
data Either a b = Left a | Right b
   The typical usage is via pattern matching for instance
factor :: (a \rightarrow c) \rightarrow (b \rightarrow c) \rightarrow Either a b \rightarrow c
factor f _ (Left x) = f x
factor _ g (Right y) = g y
C++ category
Example 2.20 (Initial object). [C++] In C++ exists a special type that
does not hold any values and as result cannot be created: void. You cannot
create an object of that type i.e. you will get a compiler error if you try.
Example 2.21 (Terminal object). [C++] C++ 17 introduced a special
type that keeps only one value - std::monostate:
namespace std {
  struct monostate {};
}
Example 2.22 (Product). [C++] The Product in C++ category keeps
a pair and the constructor defined as follows
namespace std {
  template< class A, class B > struct pair {
    A first;
    B second;
  };
}
```

std::cout << "First projector: " << p.first << std::endl;
std::cout << "Second projector: " << p.second << std::endl;</pre>

There is a simple usage example

std::pair<int, bool> p(0, false);

Really any struct or class can be considered as a product.

**Example 2.23** (Sum). [C++] If we consider Objects as types then Sum is an object that can be either one or another type. The corresponding C/C++ construction that provides an ability to keep one of two types is union.

C++17 suggests std:variant as a safe replacement for union. The example of the factor function is below

```
template <typename A, typename B, typename C, typename D>
    auto factor(A f, B g, const std::variant<C, D>& either) {
      try {
        return f(std::get<C>(either));
      }
      catch(...) {
        return g(std::get<D>(either));
      }
    };
The simple usage as follows:
    std::variant<std::string, int> var = std::string("abc");
    std::cout << "String length:" <<
    factor<>(stringLength, id, var) << std::endl;</pre>
    var = 4;
    std::cout << "id(int):" <<
    factor<>(stringLength, id, var) << std::endl;</pre>
   TBD
```

#### Scala category

**Example 2.24** (Initial object). [Scala] We used a same trick as for Initial object (Example 2.16) in **Hask** category and define Initial object in **Scala** category as a type without values

```
sealed trait Void
```

i.e. you cannot construct a object of the type.

**Example 2.25** (Terminal object). [Scala] We used a same trick as for Terminal object (Example 2.17) in **Hask** category and define Terminal object in Scala category as a type with only one value

```
abstract final class Unit extends AnyVal
```

TBD i.e. you can create only one element of the type.

TBD

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### 2.7.3 Quantum mechanics

**Example 2.26** (Initial object). [FdHilb] We will use a Hilber space of dimensional 0 as the Initial object. I.e. the set that does not have any states in it.

**Example 2.27** (Terminal object). [FdHilb] We will use a Hilber space of dimensional 1 as the Terminal object. I.e. the set of complex numbers  $\mathbb{C}$ .

**Example 2.28** (Product). [FdHilb] The Product in FdHilb category is a Direct sum of Hilber spaces.

**Example 2.29** (Sum). [FdHilb] The Sum in FdHilb category is a Direct sum of Hilber spaces.

TBD

# Chapter 3

### **Functors**

### 3.1 Definitions

**Definition 3.1** (Functor). Let  $\mathbf{C}$  and  $\mathbf{D}$  are 2 categories. A mapping  $F: \mathbf{C} \to \mathbf{D}$  between the categories is called *functor* is it preserves the internal structure (see fig. 3.1):

- $\forall a_C \in \text{ob}(\mathbf{C}), \exists a_D \in \text{ob}(\mathbf{D}) \text{ such that } a_D = F(a_C)$
- $\forall f_C \in \text{hom}(\mathbf{C}), \exists f_D \in \text{hom}(\mathbf{D}) \text{ such that dom } f_D = F(\text{dom } f_C), \text{cod } f_D = F(\text{cod } f_C).$  We will use the following notation later:  $f_D = F(f_C)$ .
- $\forall f_C, g_C$  the following equation holds:

$$F(f_C \circ f_D) = F(f_C) \circ F(g_C) = f_D \circ g_D.$$

•  $\forall x \in \text{ob}(\mathbf{C}) : F(\mathbf{1}_{x \to x}) = \mathbf{1}_{F(x) \to F(x)}$ .



Figure 3.1: Functor  $F: \mathbf{C} \Rightarrow \mathbf{D}$  definition

Remark 3.2 (Functor). When we say that functor preserve internal structure means that functor is not just mapping between Objects but also between Morphisms.

Thus functor is something that allows map one category into another. The initial category can be considered as a pattern thus the mapping is some kind of searching of the pattern inside another category.

**Definition 3.3** (Endofunctor). Let  $\mathbf{C}$  is a Category. The Functor  $E: \mathbf{C} \Rightarrow \mathbf{C}$  i.e. the functor from a category to the same category is called *endofunctor*.

**Definition 3.4** (Identity functor). Let  $\mathbf{C}$  is a Category. The Functor  $\mathbf{1}_{\mathbf{C}\Rightarrow\mathbf{C}}$ :  $\mathbf{C}\Rightarrow\mathbf{C}$  is called *identity functor* if for every object  $a\in \mathrm{ob}(\mathbf{C})$ 

$$\mathbf{1}_{\mathbf{C}\Rightarrow\mathbf{C}}(a)=a$$

and for every Morphism  $f \in \text{hom}(\mathbf{C})$ 

$$\mathbf{1}_{\mathbf{C}\Rightarrow\mathbf{C}}(f)=f$$

Remark 3.5 (Identity functor). First of all notice that Identity functor is an Endofunctor.

There is difference between identity functor and Identity morphism because the first one has deal with both Objects and Morphisms while the second one with the objects only.

**Definition 3.6** (Category Composition). TBD

**Definition 3.7** (Category Identity). TBD

**Definition 3.8 (Cat** category). TBD

As an extension of Cartesian product is used so called Category product

**Definition 3.9** (Category Product). If we have 2 categories  $\mathbf{C}$  and  $\mathbf{D}$  then we can construct a new category  $\mathbf{C} \times \mathbf{D}$  with the following components:

- Objects are the pairs (c, d) where  $c \in ob(\mathbf{C})$  and  $d \in ob(\mathbf{D})$
- Morphisms are the pair (f,g) where  $f \in \text{hom}(\mathbf{C})$  and  $g \in \text{hom}(\mathbf{D})$
- Composition (Axiom 1.7) is defined as follows  $(f_1, g_1) \circ (f_2, g_2) = (f_1 \circ f_2, g_1 \circ g_2)$
- Identity is defined as follows:  $\mathbf{1}_{C \times D \to C \times D} = (\mathbf{1}_{C \to C}, \mathbf{1}_{D \to D})$

**Definition 3.10** (Bifunctor). Bifunctor is a Functor whose Domain is a Category Product.

**Definition 3.11** (Terminal object in **Cat** category). Let consider  $\Delta_c$  is a trivial functor from Category **A** to category **C** such that  $\forall a \in \text{ob}(\mathbf{A}) : \Delta_c a = c$ -fixed object in **C** and  $\forall f \in \text{hom}(\mathbf{A}) : \Delta_c f = \mathbf{1}_{c \to c}$ .

**Definition 3.12** (Contravariant functor). If we have a categories C and D then the Functor  $C^{op} \Rightarrow D$  is called *contravariant functor*.

**Definition 3.13** (Profunctor). If we have a category C then the Bifunctor  $C^{op} \times C \Rightarrow C$  is called *profunctor*.

### 3.2 Curry-Howard-Lambek correspondence

There is an interesting correspondence between computer programs and mathematical proofs.

TBD

### 3.3 Examples

#### 3.3.1 Set category

TBD

### 3.3.2 Programming languages

#### Hask category

The functor can be defined in Haskell as follows <sup>1</sup>

Example 3.14 (Functor). [Hask]

```
class Functor f where fmap :: (a \rightarrow b) \rightarrow f a \rightarrow f b
```

Example 3.15 (Terminal object in Cat category). [Hask]

```
data Const c a = Const c
fmap :: (a -> b) -> Const c a -> Const c b
fmap f (Const c a) = Const c
```

<sup>&</sup>lt;sup>1</sup>the real definition is quite different from the current one

**Example 3.16** (Maybe as a functor). [Hask] Lets show how the Maybe a type can be constructed from different Functors and as result show that the Maybe a is also Functor.

```
data Maybe a = Nothing | Just a
-- This is equivalent to
data Maybe a = Either () (Identity a)
-- Either is a bifunctor and () == Const () a
-- Thus Maybe is a composition of 2 functors
Example 3.17 (Contravariant functor). [Hask] TBD
class Contravariant f where
      contramap :: (a \rightarrow b) \rightarrow f b \rightarrow f a
Example 3.18 (Profunctor). [Hask] TBD
class Profunctor p where
      dimap :: (a' -> a) -> (b -> b') -> p a b -> p a' b'
      -- p a b == a -> b
      dimap f g h = g . h . f
C++ category
TBD
Scala category
The functor can be defined in Haskell as follows <sup>2</sup>
Example 3.19 (Functor). [Scala]
trait Functor[F[_]] {
  def fmap[A, B](f: A \Rightarrow B): F[A] \Rightarrow F[B]
   TBD
```

#### 3.3.3 Quantum mechanics

TBD

<sup>&</sup>lt;sup>2</sup>the real definition is quite different from the current one

# Chapter 4

### Natural transformation

Natural transformation is the most important part of the category theory. It provides a possibility to compare Functors via a standard tool.

### 4.1 Definitions

The natural transformation is not an easy concept compare other one and requires some additional preparations before we can give the formal definition.

Consider 2 categories  $\mathbf{C}, \mathbf{D}$  and 2 Functors  $F : \mathbf{C} \Rightarrow \mathbf{D}$  and  $G : \mathbf{C} \Rightarrow \mathbf{D}$ . If we have an Object  $a \in \text{ob}(\mathbf{C})$  then it will be translated by different functors into different objects of category  $\mathbf{D}$ :  $a_F = Fa, a_G = Ga \in \text{ob}(\mathbf{D})$  (see fig. 4.1). There are 2 options possible

- 1. There is not any Morphism that connects  $a_F$  and  $a_G$ .
- 2.  $\exists \alpha_a \in \text{hom}(a_F, a_G) \subset \text{hom}(\mathbf{C}).$



Figure 4.1: Natural transformation: object mapping



Figure 4.2: Natural transformation: morphisms mapping



Figure 4.3: Natural transformation: commutative diagram

We can of course to create an artificial morphism that connects the objects but if we use *natural* morphisms <sup>1</sup> then we can get a special characteristic of the considered functors and categories. For instance if we have such morphisms then we can say that the considered functors are related each other. Opposite example if there is no such morphisms then the functors can be considered as unrelated each other. Another example if the morphisms are Isomorphisms then the functors can be considered as equal.

The functor is not just the object mapping but also the morphisms mapping. If we have 2 objects a and b in the category  $\mathbf{C}$  then we potentially can have a morphism  $f \in \text{hom}_{\mathbf{C}}(a,b)$ . In this case the morphism is mapped by the functors F and G into 2 morphisms  $f_f$  and  $f_G$  in the category  $\mathbf{D}$ . As result we have 4 morphisms:  $\alpha_a, \alpha_b, f_F, f_G \in \text{hom}(\mathbf{D})$ . It is natural to impose additional conditions on the morphisms especially that they form a Commutative diagram:

$$f_f \circ \alpha_b = \alpha_a \circ f_G$$
.

<sup>&</sup>lt;sup>1</sup>the word natural means that already existent morphisms from category  $\mathbf{D}$  are used

**Definition 4.1** (Natural transformation). Let F and G are 2 Functors from category  $\mathbf{C}$  to the category  $\mathbf{D}$ . The *natural transformation* is a set of Morphisms  $\alpha \subset \text{hom}(\mathbf{D})$  that satisfied the following conditions:

- For every Object  $a \in \text{ob}(\mathbf{C}) \exists \alpha_a \in \text{hom}(F(a), G(a))$  Morphism in category **D**. The morphism  $\alpha_a$  is called the component of the natural transformation.
- For every morphism  $f \in \text{hom}(\mathbf{C})$  that connects 2 objects a and b, i.e.  $f \in \text{hom}_{\mathbf{C}}(a, b)$  the corresponding components of the natural transformation  $\alpha_a, \alpha_b \in \alpha$  should satisfy the following conditions

$$f_G \circ \alpha_a = \alpha_b \circ f_F, \tag{4.1}$$

where  $f_F = F(f), f_G = G(f)$ . In other words the morphisms the morphisms form a Commutative diagram shown on the fig. 4.3.

We use the following notation (arrow with a dot) for the natural transformation between functors F and G:  $\alpha : F \to G$ .

### 4.2 Operations with natural transformations

**Example 4.2** (Fun category). The functors can be considered as objects in a special category Fun. The morphisms in the category are Natural transformations.

To define a category we need to define composition operation that satisfied Composition (Axiom 1.7), identity morphism and verify Associativity (Axiom 1.9).

For the composition consider 2 Natural transformations  $\alpha$ ,  $\beta$  and consider how they act on an object  $a \in \text{ob}(\mathbf{C})$  (see fig. 4.4). We always can construct the composition  $\beta_a \circ \alpha_a$  i.e. we can define the composition of natural transformations  $\alpha$ ,  $\beta$  as  $\beta \circ \alpha = \{\beta_a \circ \alpha_a | a \in \text{ob}(\mathbf{C})\}$ .

The natural transformation is not just object mapping but also morphism mapping. We will require that all morphisms (see fig. 4.5) commutes. The composition defined in the such way is called Vertical composition.

The functor category between categories C and D is denoted as [C, D].

**Definition 4.3** (Vertical composition). Let F, G, H are functors between categories  $\mathbf{C}$  and  $\mathbf{D}$ . Also we have  $\alpha: F \to G, \beta: G \to H$  - natural transformations. We can compose the  $\alpha$  and  $\beta$  as follows

$$\alpha \circ \beta : F \xrightarrow{\cdot} H$$
.

This composition is called *vertical composition*.



Figure 4.4: Natural transformation vertical composition: object mapping



Figure 4.5: Natural transformation vertical composition: morphism mapping - commutative diagram

**Definition 4.4** (Horizontal composition). If we have 2 pairs of functors. The first one  $F, G: \mathbf{C} \to \mathbf{D}$  and another one  $J, K: \mathbf{D} \Rightarrow \mathbf{E}$ . If we have a natural transformation between each pair:  $\alpha: F \to G$  for the first one and  $\beta: J \to K$  for the second one. We can create a new transformation

$$\alpha \star \beta : F \circ J \xrightarrow{\cdot} G \circ K$$

that is called *horizontal composition*. Note that we use a special symbol  $\star$  for the composition.

**Definition 4.5** (Left whiskering). If we have 3 categories  $\mathbf{B}, \mathbf{C}, \mathbf{D}$ , Functors  $F, G: \mathbf{C} \Rightarrow \mathbf{D}, H: \mathbf{B} \rightarrow \mathbf{C}$  and Natural transformation  $\alpha: F \rightarrow G$  then we can construct a new natural transformations:

$$\alpha H: F \circ H \xrightarrow{\cdot} G \circ H$$

that is called *left whiskering* of functor and natural transformation [7].

**Definition 4.6** (Right whiskering). If we have 3 categories C, D, E, Functors  $F, G : C \Rightarrow D, H : D \rightarrow E$  and Natural transformation  $\alpha : F \rightarrow G$  then we can construct a new natural transformations:

$$H\alpha: H \circ F \xrightarrow{\cdot} H \circ G$$

that is called *right whiskering* of functor and natural transformation [7].

**Definition 4.7** (Identity natural transformation). If  $F: \mathbb{C} \Rightarrow \mathbb{D}$  is a Functor then we can define *identity natural transformation*  $\mathbf{1}_{F \xrightarrow{} F}$  that maps any Object  $a \in \text{ob}(\mathbb{C})$  into Identity morphism  $\mathbf{1}_{F(a) \to F(a)} \in \text{hom}(\mathbb{D})$ .

Remark 4.8 (Whiskering). With Identity natural transformation we can redefine Left whiskering and Right whiskering via Horizontal composition as follows.

For left whiskering:

$$\alpha H = \alpha \star \mathbf{1}_{H \to H} \tag{4.2}$$

For right whiskering:

$$H\alpha = \mathbf{1}_{H \to H} \star \alpha \tag{4.3}$$

### 4.3 Polymorphism and natural transformation

Polymorphism plays a certain role in programming languages. Category theory provides several facts about polymorphic functions which are very important. **Definition 4.9** (Parametrically polymorphic function). Polymorphism is parametric if all function instances behave uniformly i.e. have the same realization. The functions which satisfy the parametric polymorphism requirements are parametrically polymorphic.

**Definition 4.10** (Ad-hoc polymorphism). Polymorphism is parametric if the function instances can behave differently dependently on the type they are being instantiated with.

**Theorem 4.11** (Reynolds). Parametrically polymorphic functions are Natural transformations

Proof. TBD

#### 4.3.1 Hask category

In Haskell the most functions are Parametrically polymorphic functions <sup>2</sup>.

**Example 4.12** (Parametrically polymorphic function). [Hask] Consider the following function

```
safeHead :: [a] -> Maybe a
safeHead [] = Nothing
safeHead (x:xs) = Just x
```

The function is parametrically polymorphic and by Reynolds (Theorem 4.11) is Natural transformation (see fig. 4.6).

From the definition of the natural transformation we have (4.1) therefore fmap f . safeHead = safeHead . fmap f. I.e. it does not matter if we initially apply fmap f and then safeHead to the result or initially safeHead and then fmap f.

The statement can be verified directly. For empty list we have

```
fmap f . safeHead []
-- equivalent to
fmap f Nothing
-- equivalent to
Nothing
```

from other side

<sup>&</sup>lt;sup>2</sup>really in the run-time the functions are not Parametrically polymorphic functions



Figure 4.6: Haskell parametric polymorphism as a natural transformation

```
safeHead . fmap f []
-- equivalent to
safeHead []
-- equivalent to
Nothing
For a non empty list
```

For a non empty list we have

```
fmap f . safeHead (x:xs)
-- equivalent to
fmap f (Just x)
-- equivalent to
Just (f x)
from other side
safeHead . fmap f (x:xs)
-- equivalent to
safeHead (f x: fmap f xs )
-- equivalent to
Just (f x)
```

Using the fact that fmap f is an expensive operation if it is applied to the list we can conclude that the second approach is more productive. Such transformation allows compiler to optimize the code. <sup>3</sup>

<sup>&</sup>lt;sup>3</sup>It is not directly applied to Haskell because it lazy evaluation that can perform optimization before that one

### 4.4 Examples

### 4.4.1 Set category

TBD

### 4.4.2 Programming languages

TBD

## Chapter 5

### Monads

Monads are very important for pure functional programming languages such as Haskell. We will start with formal mathematical definition and will continue with programming languages examples later.

### 5.1 Monoidal category

**Definition 5.1** (Monoidal category). A category C is called *monoidal category* if it is equipped with a Monoid structure i.e. there are

- Bifunctor  $\otimes : \mathbf{C} \times \mathbf{C} \Rightarrow \mathbf{C}$  called monoidal product
- an Object id called unit object or identity object

The elements should satisfy (up to Isomorphism) several conditions: associativity:

$$A \otimes (B \otimes C) \cong_{\alpha} (A \otimes B) \otimes C$$
,

where  $\alpha$  is called associator. id can be treated as left and right identity:

$$id \otimes A \cong_{\lambda} A,$$
  
 $A \otimes id \cong_{\rho} A,$ 

where  $\lambda, \rho$  are called as left and right unitors respectively.

**Definition 5.2** (Strict monoidal category). A Monoidal category C is said to be strict if the associator, left unitor and right unitors are all identity morphisms i.e.

$$\alpha = \lambda = \rho = \mathbf{1}_{C \to C}$$
.

Remark 5.3 (Monoidal product). The monoidal product is a binary operation that specifies the exact monoidal structure. Often it is called as *tensor product* but we will avoid the naming because it is not always the same as the Tensor product as it is introduced for Hilbert spaces

**Definition 5.4** (Tensor product). TBD

### 5.2 Category of endofunctors

The **Fun** category (Example 4.2) is an example of a category. We can apply additional limitation and consider only Endofunctors i.e. we will look at the category [C, C] - category of functors from category C to the same category. One of the most popular math definition of a monad is the following: "All told, a monad in X is just a monoid in the category of endofunctors of X"[3]. Later we will give an explanation for that one.

**Definition 5.5** (Monad). The monad M is an Endofunctor with 2 Natural transformations:

1.  $\eta: \mathbf{1}_{\mathbf{C} \Rightarrow \mathbf{C}} \xrightarrow{\cdot} M$ 

2.  $\mu: M \circ M \xrightarrow{\cdot} M$ 

where  $\mathbf{1}_{\mathbf{C}\Rightarrow\mathbf{C}}$  is Identity functor.

The  $\eta, \mu$  should satisfy the following conditions:

$$\mu \circ M\mu = \mu \circ \mu M,$$
  

$$\mu \circ M\eta = \mu \circ \eta M = \mathbf{1}_{M \to M},$$
(5.1)

where  $M\mu, M\eta$  - Right whiskerings,  $\mu M, \eta M$  - Left whiskerings,  $\mathbf{1}_{M \to M}$  - Identity natural transformation for M. Vertical composition is used in the equations (???TBD verify).

The monad will be denoted later as  $\langle M, \mu, \eta \rangle$ .

Lets look at the requirements (5.1) more closely. First of all rewrite it with (4.2) and (4.3) as follows

$$\begin{split} \mu \circ (\mathbf{1}_{M \xrightarrow{\cdot} M} \star \mu) &= \mu \circ (\mu \star \mathbf{1}_{M \xrightarrow{\cdot} M}) \,, \\ \mu \circ (\mathbf{1}_{M \xrightarrow{\cdot} M} \star \eta) &= \mu \circ (\eta \star \mathbf{1}_{M \xrightarrow{\cdot} M}) = \mathbf{1}_{M \xrightarrow{\cdot} M}. \end{split} \tag{5.2}$$

The first equation can be represented as a Commutative diagram (see fig. 5.1) Let look how the first equation acts on  $M^3 = M \circ M \circ M$ :

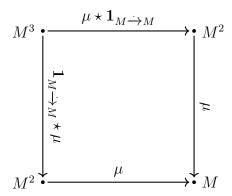


Figure 5.1: Monad as monoid in the category of endofunctors.

$$(\mathbf{1}_{M \xrightarrow{} M} \star \mu) [M \circ M \circ M] = (\mathbf{1}_{M \xrightarrow{} M} \star \mu) [M \circ (M \circ M)] = \\ = M \circ (M \otimes M),$$

where properties Horizontal composition and the following equations were used:

$$\mu(M \circ M) = M \otimes M \in [\mathbf{C}, \mathbf{C}]$$

and

$$\mathbf{1}_{M \to M} (M) = M.$$

Therefore

$$\mu \circ (\mathbf{1}_{M \to M} \star \mu) [M \circ M \circ M] =$$

$$= \mu [M \circ (M \otimes M)] = M \otimes (M \otimes M). \tag{5.3}$$

The second part of the first equation (5.2) gives us

$$\mu \left(\mu \star \mathbf{1}_{M \to M}\right) [M \circ M \circ M] =$$

$$= \mu \left(\mu \star \mathbf{1}_{M \to M}\right) [(M \circ M) \circ M] =$$

$$= \mu \left[(M \otimes M) \circ M\right] = (M \otimes M) \otimes M. \tag{5.4}$$

Combining (5.3) and (5.4) one can get

$$M \otimes (M \otimes M) = (M \otimes M) \otimes M$$

i.e. the first equation (5.2) provides the associativity (the first property that each Monoid should satisfy).

There should be an identity element for each Monoid. Lets show that the second equation of (5.2) provides us the required element. Lets  $I \in \text{hom}(\mathbf{C})$  and  $U = \eta(I)$ . We want to show that

$$U \otimes M \cong M \otimes U \cong M$$

that is exactly required as identity presence in the Monoid definition. Consider the action of the left part of second equation (5.2) on  $M \circ I$ :

$$\mu \circ (\mathbf{1}_{M \to M} \star \eta) [M \circ I] =$$
$$= \mu [M \circ U] = M \otimes U$$

For the middle part of second equation (5.2)

$$\mu \circ (\eta \star \mathbf{1}_{M \to M}) [I \circ M] =$$
$$= \mu [U \circ M] = U \otimes M.$$

We assume that  $M \circ I \cong M$  and  $I \circ M \cong M$  thus finally

$$M \otimes U \cong U \otimes M \cong M$$

that finals the proof of monoidal structure.

# 5.3 Kleisli category. Monads in programming languages

**Definition 5.6** (Kleisli category). Let  $\mathbf{C}$  is a category, M is an Endofunctor and  $\langle M, \mu, \eta \rangle$  is a Monad. Then we can construct a new category  $\mathbf{C}_{\mathbf{M}}$  that is called as  $Kleisli\ category\$ as follows:

$$ob(\mathbf{C}_{\mathbf{M}}) = ob(\mathbf{C}),$$
  
 $hom_{\mathbf{C}_{\mathbf{M}}}(a, b) = hom_{\mathbf{C}}(a, M(b))$ 

i.e. objects of categories C and  $C_M$  are the same but morphisms from  $C_M$  form a subset of morphisms  $C_M$ :  $hom(C_M) \subset hom(C)$ .

### 5.3.1 Programming languages

Kleisli category widely spread in programming especially it provides good description for different types of computations, for instance [5, 4]

- Partiality i.e. then a function not defined for each input, for instance the following expression is undefined (or partially defined) for x = 0:  $f(x) = \frac{1}{x}$
- Non-Determinism i.e. then multiply output are possible
- Side-effects i.e. TBD

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- Exception i.e. TBD
- Continuation i.e. TBD
- Interactive input i.e. TBD
- Interactive output i.e. TBD

TBD

### 5.4 Examples

#### 5.4.1 Programming languages

#### Haskell

**Example 5.7** (Monad). [Hask] In Haskell monad can be defined from Functor (Example 3.14) as follows <sup>1</sup>

```
class Functor m => Monad m where
  return :: a -> m a
  (>>=) :: m a -> (a -> m b) -> m b
```

To show how this one can be get we can start from a definition that is similar to the math definition:

```
class Functor m => Monad m where
  return :: a -> m a
  join :: m (m a) -> m a
```

where **return** can be treated as  $\eta$  and **join** as  $\mu$ . In the case the bind operator >>= can be implemented as follows

```
(>>=) :: m a -> (a -> m b) -> m b
ma >>= f = join ( f ma )

TBD
```

C++

TBD

<sup>&</sup>lt;sup>1</sup>real definition is quite different from the presented one

#### Scala

**Example 5.8** (Monad). [Scala] The monad concept is Scala is more close to formal math definition for Monad. It can be defined as follows <sup>2</sup>

#### 5.4.2 Quantum mechanics

The tensor product in quantum mechanics is used for representing a system that consists of multiple systems. For instance if we have an interaction between an 2 level atom (a is excited state b as a ground state) and one mode light then the atom has its own Hilber space  $\mathcal{H}_{at}$  with  $|a\rangle$  and  $|b\rangle$  as basis vectors. Light also has its own Hilber space  $\mathcal{H}_f$  with Fock state  $\{|n\rangle\}$  as the basis. <sup>3</sup> The result system that describes both atom and light is represented as the tensor product  $\mathcal{H}_{at} \otimes \mathcal{H}_f$ .

The morphisms of **FdHilb** category have a connection with Tensor product. Consider the so called Hilbert-Schmidt correspondence for finite dimensional Hilbert spaces i.e. for given  $\mathcal{A}$  and  $\mathcal{B}$  there is a natural isomorphism between the tensor product and linear maps (aka morphisms) between  $\mathcal{A}$  and  $\mathcal{B}$ :

$${\cal A}^*\otimes {\cal B}\cong \hom({\cal A},{\cal B})$$
 where  ${\cal A}^*$  - Dual space.   
 TBD

<sup>&</sup>lt;sup>2</sup>real definition is quite different from the presented one

<sup>&</sup>lt;sup>3</sup> Really the  $\mathcal{H}_f$  is infinite dimensional Hilber space and seems to be out of our assumption about **FdHilb** category as a collection of finite dimensional Hilber spaces only.

# Chapter 6

# Yoneda's lemma

TBD

### 6.1 Examples

### 6.1.1 Quantum mechanics

Flori interpretation of quantum mechanics

TBD

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