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1. Introduction

to write

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1. Introduction

1.1. Thesis

The thesis of this book is that most engineering fields would benefit from knowing and using the language of applied category theory to address the design and analysis of complex systems.

1.2. Systems and components

What is a “system”?

Here is a great quote¹:

A system is composed of components;
a component is something you understand.

The first part of the quote, “A system is *composed of components*”, is plain as day as much as it is tautological. We could equally say: “A system is *partitioned in parts*”.

The second part, “a component is something you understand”, is where the insight lies: we call “system” what is too complex to be understood naturally by a human.

Haiken referred to computer engineering, but we find exactly the same sentiment expressed in other fields. In systems engineering, Leveson puts it as “complexity can be defined as intellectual unmanageability” [leveson12engineering].

We will be content of this anthropocentric and slightly circular definition of systems and complexity: “systems” are “complex” and “components” are “simple”.

Whether something is a complex system also depends on the task that we need to do with it. One way to visualize this is to imagine a “phenomenon” as a high-dimensional object that we can see from different angles (Fig. 1.1). For each task, we have a different projection. The decomposition of the system in components can be different according to the task. For example, a system that might be easy to simulate could be very difficult to control.

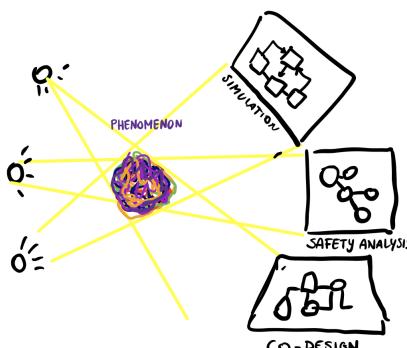


Figure 1.1.: Engineers live in a Plato’s cave with multiple light sources. A certain phenomenon can be illuminated from different angles and look very different, very simple or complex.

Make better figure

¹This quote is by Howard Aiken (1900-1973), creator of the MARK I computer, as quoted by Kenneth E. Iverson (1920-2004), creator of programming language APL, as quoted in [McIntyre1999Role], but ultimately sourceless and probably apocryphal.

1.3. What ACT can do for you

describe how ACT can help

1.4. What ACT cannot do

describe limitations of ACT

1.5. Book organization

To write.

1.6. Contributors

To write.

1. Introduction

Part A.

A first look at Applied Category Theory

2. Overview

to write

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2. Overview

2.1. Everything is the same

Reproduce here the discussion from the first lecture, about many different things that are actually the same.

2.2. Guidebook

Broader overview of the abstractions that we will develop in this book, including posets, lattices, etc. up to operad.

3. Transmutation

to write

Contents

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3. Transmutation

3.1. Interfaces and transformations

Gives more examples before getting to the definition. Give more examples with different conventions for the arrow direction.

In engineering design, one creates *systems* out of *components*. Each component has a reason to be in there. We will show how category theory can help in formalizing the chains of causality that underlie a certain design.

We will need to reason at the level of abstraction where we consider the “function”, or “functionality”, which each component provides, and the “requirements” that are needed to provide the function.

We will start with a simple example of the functioning principle of an electric car.

In an electric car, there is a battery, a store of the electric energy resource. We can see the production of motion as the chain of two transformations:

- The **motor** transmutes the **electricity** into **rotation**.
- The **rotation** is converted into **translation** by the **wheels** and their friction with the road.

We see that there are two types of things in this example:

1. The “transmuters”: the **motor** and **wheels**.
2. The “transmuted”: the **electricity**, the **rotation**, the **translation**.

For a first qualitative description of the scenario, we might choose to just keep track of what is transmuted into what. We can draw a diagram in which each resource is a point (Fig. 3.1).



Figure 3.1.: Resources in the electric car example.

Now, we can draw arrows between two points if there is a transmuter between them.

We choose the direction of the arrow such that

$$X \xrightarrow{\text{transmuter}} Y \tag{3.1}$$

means that “using transmuter, having **Y** is sufficient to produce **X**”.

Remark 3.1 (Are we going the wrong direction?). The chosen direction for the arrows is completely the opposite of what you would expect if you thought about “input and outputs”. There is a good reason to use this convention, though it will be apparent only a few chapters later. In the meantime, it is a good exercise to liberate your mind about the preconception of what an arrow means; in category theory there will be categories where the arrows represent much more abstract concepts than input/output.

Another way to write Eq. (3.1) would be as follows:

$$\text{transmuter} : X \rightarrow Y. \tag{3.2}$$

This is now to you something syntactically familiar; when we study the categories of sets and functions between sets we will see that in that context the familiar meaning is also the correct meaning.

With these conventions, we can describe the two transmuters as these arrows:

$$\text{motor} : \text{rotation} \rightarrow \text{electricity}, \tag{3.3}$$

$$\text{wheels} : \text{translation} \rightarrow \text{rotation}. \tag{3.4}$$

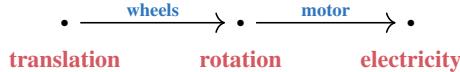


Figure 3.2.: Transmuters are arrows between resources.

We can put these arrows in the diagrams, and obtain the following (Fig. 3.2).

In this representation, the arrows are the components of the system. We will learn how to compose these arrows according to the rules of category theory. The basic rule will be *composition*. If we use the semantics that an arrow from resource X to resource Y means “having Y is enough to obtain X ”, then, since Y is enough for Y per definition, we can add a self-loop for each resource. We will call the self-loops *identities* (Fig. 3.3).

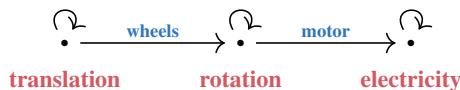


Figure 3.3.: System components and identities.

Furthermore, we might consider the idea of composition of arrows. Suppose that we know that

$$X \xrightarrow{a} Y \quad \text{and} \quad Y \xrightarrow{b} Z,$$

that is, using a b we can get a Z from a Y , and using an a we can get a X from a Y , then we conclude that using an a and a b we can get an X from a Z .

In our example, if the arrows **wheels** and **motor** exist, then also the arrow “**wheels** then **motor**” exists (Fig. 3.4).

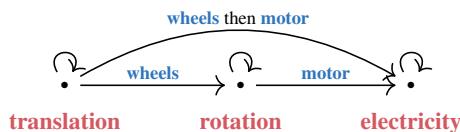


Figure 3.4.: Composition of system components.

So far, we have drawn only one arrow between two points, but we can draw as many as we want. If we want to distinguish between different brands of motors, we would just draw one arrow for each model. For example, Fig. 3.5 shows two models of motors (**motor A**, and **motor B**) and two models of wheels (**wheels U** and **wheels V**).

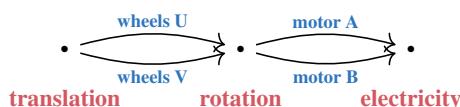


Figure 3.5.: Multiple models for wheels and motors.

The figure implies now the existence of *four* composed arrows: “**wheels U** then **motor A**”, “**wheels U** then **motor B**”, “**wheels V** then **motor A**”, and “**wheels V** then **motor B**”, all going from **translation** to **electricity**;

3. Transmutation

A “category” is an abstract mathematical structure that captures the properties of these systems of points and arrows and the logic of composition.

The basic terminology is that the points are called **objects**, and the arrows are called **morphisms**.

In our example, the **motor** and the **wheels** are the morphisms, and **electricity**, **rotation**, **translation** are the objects.

Many things can be defined as categories and we will see many examples in this book.

We are now just biding our time before introducing the formal definition of category. At first sight it will be intimidating: there are four parts to the definition, two axioms to define. Moreover, it is quite a bit technical and it takes half a page to write.

3.2. Formal definition of category

The following is the formal definition.

Definition 3.2 (Category). A *category* \mathbf{C} is specified by four components:

1. **Objects**: a collection¹ $\mathbf{Ob}_{\mathbf{C}}$, whose elements are called *objects*.
2. **Morphisms**: for every pair of objects $X, Y \in \mathbf{Ob}_{\mathbf{C}}$, there is a set $\mathbf{Hom}_{\mathbf{C}}(X, Y)$, elements of which are called *morphisms* from X to Y . The set is called the “hom-set from X to Y ”.
3. **Identity morphisms**: for each object X , there is an element $\text{id}_X \in \mathbf{Hom}_{\mathbf{C}}(X, X)$ which is called the *identity morphism of X* .
4. **Composition rules**: given any morphism $f \in \mathbf{Hom}_{\mathbf{C}}(X, Y)$ and any morphism $g \in \mathbf{Hom}_{\mathbf{C}}(Y, Z)$, there exists a morphism $f \circ g \in \mathbf{Hom}_{\mathbf{C}}(X, Z)$ which is the *composition of f and g* .

Furthermore, the constituents are required to satisfy the following conditions:

1. **Unitality**: for any morphism $f \in \mathbf{Hom}_{\mathbf{C}}(X, Y)$,

$$\text{id}_X \circ f = f = f \circ \text{id}_Y. \quad (3.5)$$

2. **Associativity**: for $f \in \mathbf{Hom}_{\mathbf{C}}(X, Y)$, $g \in \mathbf{Hom}_{\mathbf{C}}(Y, Z)$, and $h \in \mathbf{Hom}_{\mathbf{C}}(Z, W)$,

$$(f \circ g) \circ h = f \circ (g \circ h). \quad (3.6)$$

Remark 3.3 (Are we sure we are not going in the wrong direction?). We denote composition of morphisms in a somewhat unusual way—sometimes preferred by category-theorists and computer scientists—namely in *diagrammatic order*.

That is, given $f : X \rightarrow Y$ and $g : Y \rightarrow Z$, we denote their composite by $(f \circ g) : X \rightarrow Z$, pronounced “ f then g ”. This is in contrast to the more typical notation for composition, namely $g \circ f$, or simply gf , which reads as “ g after f ”. The notation $f \circ g$ is sometimes called *infix notation*.

We promise, at some point it will be clear what are the advantages of seemingly doing everything in the wrong direction.

Note that we may save some ink when drawing diagrams of morphisms:

¹A “collection” is something which may be thought of as a set, but may be “too large” to technically be a set in the formal sense. This distinction is necessary in order to avoid such issues as Russel’s paradox.

- We do not need to draw the identity arrows from one object to itself, because, by Definition 3.2, they always exist.
- Given arrows $X \rightarrow Y$ and $Y \rightarrow Z$, we do not need to draw their composition because, by Definition 3.2, this composition is guaranteed to exist.

With these conventions, we can just draw the arrows **motor** and **wheels** in the diagram, and the rest of the diagram is implied (Fig. 3.6).

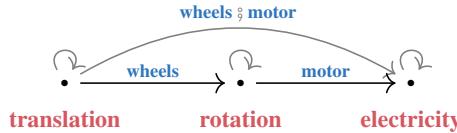


Figure 3.6.: Electric car example. The grey arrows are implied by the properties of a category.

In particular, the electric car example corresponds to the category C specified by

- *Objects:* $\text{Ob}_C = \{\text{electricity}, \text{rotation}, \text{translation}\}$.
- *Morphisms:* The system components are the morphisms. For instance, we have **motor**, **wheels**, and the morphism **wheels ; motor**, implied by the properties of the category.

We can slightly expand this example by noting the reverse transformations. In an electric car it is possible to regenerate power; that is, we can obtain **rotation** of the **wheels** from **translation** (via the morphism **move**), and then convert the **rotation** into **electricity** (via the morphism **dynamo**) (Fig. 3.7, Fig. 3.8).

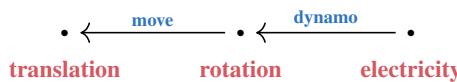


Figure 3.7.: Electric power can be produced from motion.

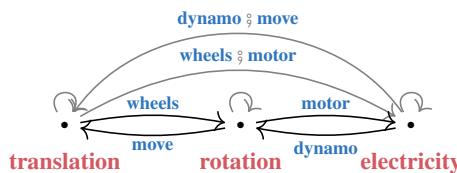


Figure 3.8.: Electric car example: forward and backward transformations.

Given the semantics of the arrows in a category, all compositions of arrows exist, even if they are not drawn explicitly. For example, we can consider the composition **wheels ; motor ; dynamo ; move**, which converts **translation** into **rotation**, into **electricity**, then back to **rotation** and **translation**. Note that this is an arrow that has the same head and tail as the identity arrow on **translation** (Fig. 3.9). However, these two arrows are not necessarily the same. In this example we are representing physical systems, so we would in fact not expect them to be the same, since there will be some losses during the many conversions.

The directionality of the arrows is also important. While the convention of which resource is the tail and which the head is just a typographic convention, it might be the case that we know how to convert one resource into another, but not vice versa. Fig. 3.10 shows an example of a diagram that describes a process which is definitely not invertible.

3. Transmutation

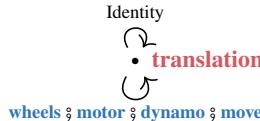


Figure 3.9.: There can be multiple morphisms from an object to itself.



Figure 3.10.: An example of a process which is not invertible.

3.3. Currency categories

In this section, we introduce a kind of category for describing currency exchangers. Our idea is to model currencies as objects of a category, and morphisms will describe ways of exchanging between those currencies, e.g., as offered by a currency exchange service.

We start with a set **C** of labels for all the currencies we wish to consider, i.e.:

$$\mathbf{C} = \{\mathbf{EUR}, \mathbf{USD}, \mathbf{CHF}, \mathbf{SGD}, \dots\}.$$

For each currency $c \in \mathbf{C}$ we define an object $\mathbb{R} \times \{c\}$ which represents possible amounts of the given currency c (we will ignore the issue of rounding currencies to an accuracy of two decimal places, and we allow negative amounts). The currency label keeps track of which “units” we are using.

Now consider two such objects, say $\mathbb{R} \times \{\mathbf{USD}\}$ and $\mathbb{R} \times \{\mathbf{EUR}\}$. How can we describe the process of changing an amount of USD to an amount of EUR? We model this using two numbers: an exchange rate a and a commission b for the transaction. Given an amount $x \in \mathbb{R}$ of USD, we define a morphism (a currency exchanger) as:

$$E_{a,b} : \mathbb{R} \times \{\mathbf{USD}\} \rightarrow \mathbb{R} \times \{\mathbf{EUR}\},$$

by the formula

$$\langle x, \mathbf{USD} \rangle \mapsto \langle ax - b, \mathbf{EUR} \rangle.$$

Note that the commission is given in the units of the target currency. Of course, for changing USD to EUR, there may be various different banks or agencies which each offer different exchange rates and/or different commissions. Each of these corresponds to a different morphism from $\mathbb{R} \times \{\mathbf{USD}\}$ to $\mathbb{R} \times \{\mathbf{EUR}\}$.

To build our category, we also need to specify how currency exchangers compose. Given currencies c_1, c_2, c_3 , and given currency exchangers

$$E_{a,b} : \mathbb{R} \times \{c_1\} \rightarrow \mathbb{R} \times \{c_2\} \quad \text{and} \quad E_{a',b'} : \mathbb{R} \times \{c_2\} \rightarrow \mathbb{R} \times \{c_3\}$$

we define the composition $E_{a,b} \circ E_{a',b'}$ to be the currency exchanger

$$E_{aa',a'b+b'} : \mathbb{R} \times \{c_1\} \rightarrow \mathbb{R} \times \{c_3\}. \tag{3.7}$$

In other words, we compose currency exchangers as one would expect: we multiply the first and the second exchange rates together, and we add the commissions (paying attention to first transform the first commission into the units of the final target currency).

Finally, we also need to specify unit morphisms for our category. These are currency exchangers which “do nothing”. For any object $\mathbb{R} \times \{c\}$, its identity morphism is

$$E_{1,0} : \mathbb{R} \times \{c\} \rightarrow \mathbb{R} \times \{c\},$$

the currency exchanger with exchange rate “1” and commission “0”.

It is straightforward to check that the composition of currency exchangers as defined above obeys the associative law, and that the identity morphisms act neutrally for composition. Thus we indeed have a category!

Remark 3.4. In the above specification of our category of currency exchangers, we can actually just work with the set of currency labels \mathbf{C} as our objects, instead of using “amounts” of the form $\mathbb{R} \times \{\mathbf{c}\}$ as our objects. Indeed, on a mathematical level, the definition of currency exchangers and their composition law Eq. (3.7) do not depend on using amounts! Namely, a currency exchanger $E_{a,b}$ is specified by the pair of numbers $\langle a, b \rangle$, and the composition law Eq. (3.7) may then, in this notation, be written as

$$\langle a, b \rangle ; \langle a', b' \rangle = \langle a'a, a'b + b' \rangle. \quad (3.8)$$

The interpretation is still that currency exchangers change amounts of one currency to amounts in another currency, but for this we do not need to carry around copies of \mathbb{R} in our notation.

Following the above remark:

Definition 3.5 (Category \mathbf{Curr}). The *category of currencies* \mathbf{Curr} is specified by:

1. *Objects*: a collection of currencies \mathbf{C} .
2. *Morphisms*: given two currencies $\mathbf{c}_1, \mathbf{c}_2 \in \mathbf{C}$, morphisms between them are currency exchangers $\langle a, b \rangle$ from \mathbf{c}_1 to \mathbf{c}_2 .
3. *Identity morphism*: given an object $\mathbf{c} \in \mathbf{C}$, its identity morphism is the currency exchanger $\langle 1, 0 \rangle$. We also call such morphisms “trivial currency exchangers”.
4. *Composition of morphisms*: the composition of morphisms is given by the formula Eq. (3.8).

As an illustration, consider three currency exchange companies **ExchATM**, **MoneyLah**, and **Frankurrencies**, which operate on several currencies (Table 3.1).

Company name	Exchanger label	Direction	a (exchange rate)	b (fixed commission)
ExchATM	<i>A</i>	USD to CHF	0.95 CHF/USD	2.0 CHF
ExchATM	<i>B</i>	CHF to USD	1.05 USD/CHF	1.5 USD
ExchATM	<i>C</i>	USD to SGD	1.40 SGD/USD	1.0 SGD
MoneyLah	<i>D</i>	USD to CHF	1.00 CHF/USD	1.0 CHF
MoneyLah	<i>E</i>	SGD to USD	0.72 USD/SGD	3.0 USD
Frankurrencies	<i>F</i>	EUR to CHF	1.20 CHF/EUR	0.0 CHF
Frankurrencies	<i>G</i>	CHF to EUR	1.00 EUR/CHF	1.0 EUR

Table 3.1.: Three currency exchange companies operating different currencies.

We can represent this information as a graph, where the nodes are the currencies and the edges are particular exchange operations (Fig. 3.11).

There is a currency category built from the information in Table 3.1 and the graph in Fig. 3.11. Its collection of objects is the set $\{\mathbf{EUR}, \mathbf{USD}, \mathbf{CHF}, \mathbf{SGD}\}$, and its morphisms are, in total:

- the trivial currency exchanger (identity morphism) $\langle 1, 0 \rangle$ for each of the four currencies (which are the objects),
- the currency exchangers corresponding to each item in Table 3.1,
- all possible compositions of the currency exchangers listed in Table 3.1.

The phrase “all possible compositions” is a bit vague. What we mean here can be made more precise. It corresponds to a general recipe for starting with a graph G , such as in Fig. 3.11, and obtaining

3. Transmutation

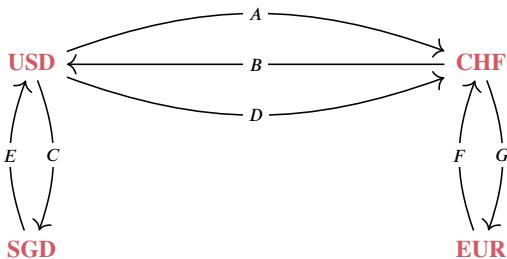


Figure 3.11.: Three currency exchange companies operating different currencies as a graph.

from it an associated category, called the *free category on G* . We introduce this concept in the next section.

Exercise 3.6 (Temperatures). Define a category of temperature converters, where the objects are **Celsius**, **Kelvin**, **Fahrenheit**, and the morphisms are the rules to transform a measurement from one unit to another.

What relation is there with the currency category?

4. Culture

to write

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4. Culture

4.1. Definitional impetus vs. computational goals

The category **Curr** represents the set of all possible currency exchangers that could ever exist. However, in this set there would be very irrational agents. For example, there is a currency exchanger that, given 1 **USD**, will give you back 2 **USD**; there is one currency exchanger that corresponds to converting **USD** to **CHF** back and forth 21 times before getting you the money. There is even one that will not give you back any money.

Moreover, using the composition operations we could produce many more morphisms. In fact, if there are loops, we could traverse the loops multiple times, and, depending on the numbers, finding new morphisms, possibly infinitely many more.

This highlights a recurring topic: often mathematicians will be happy to define a broader category of objects, while, in practice, the engineer will find herself thinking about a more constrained set of objects. In particular, while the mathematician is more concerned with defining categories as hypothetical universes of things, the engineer is typically interested in representing concrete things, and solve some computational problem on the represented structure.

For example, in the case of the currency exchangers, the problem might be that of finding the sequence of the best conversions between a source and a target currency.

First, the engineer would add more constraints to the definition to work with more well-behaved objects. For example, it is reasonable to limit the universe of morphisms in such a way that the action of converting back and forth the same currency to have a cost (through the commission) higher than 0.

In that case, we will find that the optimal paths of currencies never pass through a currency more than once. To see this, consider three currencies **A**, **B**, **C**, a currency exchanger $\langle a, b \rangle$ from **A** to **B**, a currency exchanger $\langle c, d \rangle$ from **B** to **C**, and a currency exchanger $\langle e, f \rangle$ from **C** to **A**. The composition of the currency exchangers reads:

$$\underbrace{\langle eca}_{g}, \underbrace{ecb + ed + f}_{h} \rangle.$$

Assuming $e = a^{-1}$ (i.e., an exchange rate direction is not more profitable than the other), and $h \neq 0$, because of the commissions one can show that there are multiple morphisms from **A** to **A**, and that the identity morphism is the most “convenient” one. If we only pass through each currency at most once, there are only a finite amount of paths to check, and this might simplify the computational problem.

Second, the engineer might be interested in keeping track only of the “dominant” currency exchangers. For example, if we have two exchangers with the same rate but different commission, we might want to keep track only of the one with the lowest commission.

In the next chapters we will see that there are concepts that will be useful to model these situations:

- There is a concept of *subcategory* that allows to define more specific categories of a parent one, in a way that still satisfies the axioms.
- There is a concept called *locally posetal* categories, in which the set of morphisms between two objects is assumed to be a *poset* rather than a *set*, that is, we assume that there is an order, and that this order will be compatible with the operation of composition.

4.2. Things that don't matter

In engineering we know that **using the right conventions is essential**.

There are many famous examples of unit mismatches causing disasters or near-disasters:

- The loss of the Mars Climate Orbiter in 1999 was due to the fact that NASA used the metric system, while contractor Lockheed Martin used (by mistake) imperial units.
- In 1983, an Air Canada's Boeing 767 jet ran out of fuel in mid-flight because there was a miscalculation of the fuel needed for the trip. In the end, the pilot managed to successfully land the "Gimli Glider".
- Going back in history, Columbus wound up in the Bahamas because he miscalculated the Earth's circumference, due to several mistakes, and one of them was assuming that his sources were using the *Roman mile* rather than the *Arabic mile*.¹ Columbus' mathematical mistakes led to a happy incident for him, but not so great outcomes for many others.

However, in category theory, we look at the “essence” of things, and we consider **what is true regardless of conventions**.

Just like this book is written in rather plain English, and could be translated to another language while preserving the meaning, in category theory we look at what is not changed by a 1:1 translation that can be reversed.

This will be covered later in a section on “isomorphisms”; but for now we can look at this in an intuitive way.

4.2.1. Typographical conventions don't matter

Some of you might have objected to the conventions that we used in this chapter for the notation for composition of morphisms. We have used the notation $f \circ g$ (“ f then g ”) while usually in the rest of mathematics we would have used $g \circ f$ (“ g after f ”). However, any concept we will use is “invariant” to the choice of notation. We can decide to rewrite the book using the other convention and still all the theorems would remain true, and all the falsities will remain false. More technically, we can take any formula written in one convention and rewrite it with the other convention, and viceversa. For example, the formula

$$(f \circ g) \circ h = f \circ (g \circ h)$$

would be transformed in

$$h \circ (g \circ f) = (h \circ g) \circ f.$$

(A bit more advanced category theory can describe this transformation more precisely.)

The same considerations apply for the convention regarding the arrow directions. If we have a category with morphisms such as

$$\text{motor} : \text{rotation} \rightarrow \text{electricity}$$

with the semantics of “the **motor** can produce **rotation** given **electricity**”, we could define a *different* category, where the conventions are inverted. In this other category, for which we use arrows of different color, we would write

$$\text{motor} : \text{electricity} \rightarrow \text{rotation}$$

and the semantics would be “the **motor** consumes **electricity** to produce **rotation**” (Fig. 4.1).

These two categories would have the same objects, and the same number of arrows; it's just that the arrows change direction when moving from one category to the other. In particular, there exists a transformation which maps every black arrow to a blue arrow, revertin the direction (Fig. 4.2). This transformation is invertible. Intuitively, we would not expect anything substantial to change, because we are just changing a convention. We will see that there is a concept called *opposite category* that formalizes this idea of reversing the direction of the arrows.

¹IEEE Spectrum

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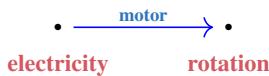
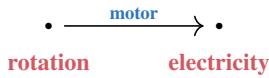


Figure 4.1.: Opposite convention for arrows direction.

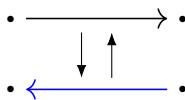


Figure 4.2.

Diagrams conventions don't matter

Now that we are flexed our isomorphism muscles, we can also talk about the isomorphisms of the visual language.

In engineering, “boxes and wires” diagrams are commonly used to talk about materials transformations and signal flows. In those diagrams one would use boxes to describe the processes and the wires to describe the materials or information that is being transformed. Boxes have “inputs” and “outputs”, and arrows have directions representing the causality. From left to right, what is to the left causes what is to the right. The left-to-right directionality seems an utterly obvious choice for most of you who learned languages that are written left-to-right, top-to-bottom as in this book².

Fig. 4.3 shows how we would have visually described the first example using the boxes-and-wires conventions. Again, we say that this is just a different convention, because we have a procedure to transform one diagram into the other. This is not as simple as changing the direction of the arrows as in the case of an opposite category. Rather, to go from points-and-arrows to boxes-and-wires:

- Arrows that describe transmutes become boxes that describe processes;
- The points that describe the resources become wires between the boxes.

Expand example as in the slides

²Note that this paragraph cannot be translated literally to Japanese. It breaks the assumption that we made before, about the fact that we can have a 1:1 literal translation of this book without changing the meaning. You might think that our future hypothetical Japanese translator can make an outstanding job and translate also our figures to go right-to-left, then saying that right-to-left is natural to people that write right-to-left. However, that does not work, because in fact Japanese engineers also use left-to-right diagrams.

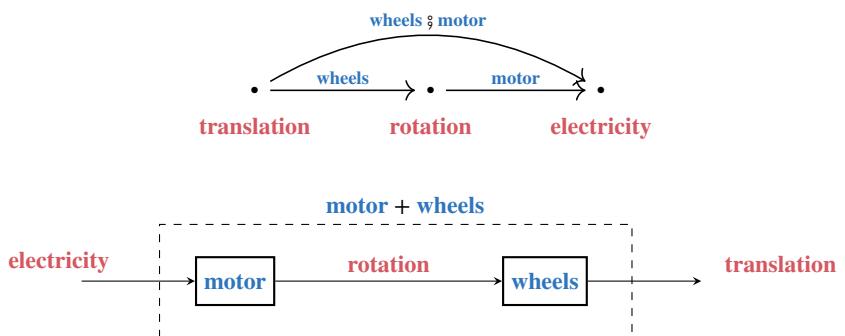


Figure 4.3.: Isomorphisms of resource diagrams.

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5. Connection

Currency categories illustrated how one can use category theory to think about things transforming into each other. In this chapter, we want to think about how things connect to each other.

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5. Connection

5.1. Mobility

For a specific mode of transportation, say a car, we can define a graph

$$G_c = \langle V_c, A_c, s_c, t_c \rangle,$$

where V_c represents geographical locations which the car can reach and A_c represents the paths it can take (e.g. roads). Similarly, we consider a graph $G_s = \langle V_s, A_s, s_s, t_s \rangle$, representing the subway system of a city, with stations V_s and subway lines going through paths A_s , and a graph $G_b = \langle V_b, A_b, s_b, t_b \rangle$, representing onboarding and offboarding at airports. In the following, we want to express intermodality: the phenomenon that someone might travel to a certain intermediate location in a car and then take the subway to reach their final destination.

By considering the graph $G = (V, A, s, t)$ with $V = V_c \cup V_s \cup V_b$ and $A = A_c \cup A_s \cup A_b$, we obtain the desired intermodality graph. Graph G can be seen as a new category, with objects V and morphisms A .

Example 5.1. Consider the **car** category, describing your road trip in California, with

$$V_c = \{SFO_c, S. Mateo, Half Moon Bay, SBP_c, Lake Balboa, LAX_c\},$$

and arrows as in Fig. 5.1. The nodes represent typical touristic road-trip checkpoints in California and the arrows represent famous highways connecting them.

SFO_c — US101 → S. Mateo — CA92 → H. M. Bay — CA1 → SBP_c — US101S → Lake Balboa — I405 → LAX_c

Figure 5.1.: The **car** category.

Furthermore, consider the **flight** category with $V_f = \{SFO_f, SJC, SBP_f, LAX_f\}$ and arrows as in Fig. 5.2. The nodes represent airports in California and the arrows represent connections, offered by specific flight companies.

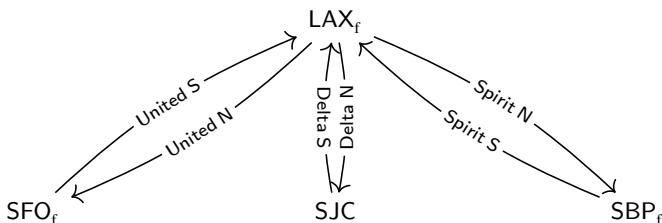


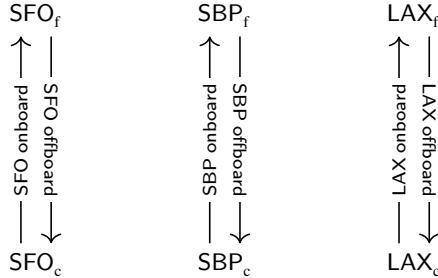
Figure 5.2.: The **flight** category.

We then consider the **board** category, with nodes

$$V_b = \{SFO_f, SFO_c, SBP_f, SBP_c, LAX_f, LAX_c\}$$

and arrows as in Fig. 5.3. Nodes represent airports and airport parkings, and arrows represent the onboarding and offboarding paths one has to walk to get from the parkings to the airport and vice-versa.

The combination of the three, which we call the *intermodal graph*, can be represented as a graph, with red arrows for the car network, blue arrows for the flight network, green arrows for the boarding


 Figure 5.3.: The **board** category.

network, and black dashed arrows for intermodal morphisms, arising from composition of morphisms involving multiple modes (Fig. 5.4). Imagine that you are in the parking lot of LAX airport and you want to reach S. Mateo. From there, you will e.g. onboard to a United flight to SFO_f , will then offboard reaching the parking lot SFO_c , and drive on highway US-101 reaching S. Mateo. This is intermodality.

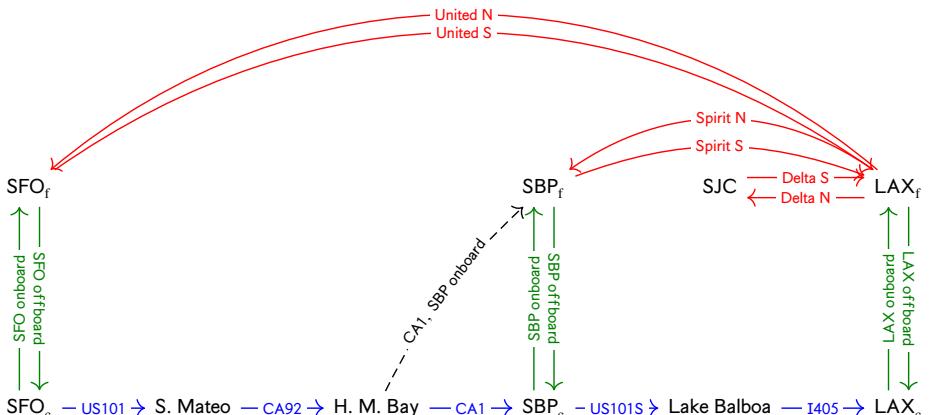


Figure 5.4.: Intermodal graph. The dashed arrows represent intermodal morphisms, and we depict just one of them for simplicity.

The intermodal network category **intermodal** is the free category on the graph illustrated in Fig. 5.4.

5.2. Trekking in the Swiss Mountains

In the section we'll discuss a more “continuum-flavored” (as opposed to “discrete-flavored”) example of how one might describe “connectedness” using a category.

Suppose we are planning a hiking tour in the Swiss Alps. In particular, we wish to consider various routes for hikes. We have a map of the relevant region which uses coordinates $\langle x, y, z \rangle$. We assume

5. Connection

the z -th coordinate is given by an “elevation function”, $z = h(x, y)$, and that h is C^1 , i.e. continuously differentiable. This means that our map of the landscape forms a C^1 -manifold; let’s call it L .

We will now define a category where the morphisms are built from C^1 paths through the landscape, and such that these paths can be composed, essentially, by concatenation. We take paths which are C^1 so that we can speak of the slope (steepness) of a path in any given point, as given by its derivative.

Definitely we need a picture of Swiss mountains

To set things up, we need to have a way to compose C^1 paths such that their composition is again C^1 . For this, the derivative (velocity) at the end of one path must match the starting velocity of the subsequent path.

Definition 5.2 (Berg). Let **Berg** be the category defined as follows:

- Objects are tuples $\langle p, v \rangle$, where
 - $p \in L$,
 - $v \in \mathbb{R}^3$ (we think of this as a tangent vector to L at p).
- A morphism $\langle p_1, v_1 \rangle \rightarrow \langle p_2, v_2 \rangle$ is $\langle \gamma, T \rangle$, where
 - $T \in \mathbb{R}_{\geq 0}$,
 - $\gamma : [0, T] \rightarrow L$ is a C^1 function with $\gamma(0) = p_1$ and $\gamma(T) = p_2$, as well as $\dot{\gamma}(0) = v_1$ and $\dot{\gamma}(T) = v_2$ (we take one-sided derivatives at the boundaries).
- For any object $\langle p, v \rangle$, we define its identity morphism $1_{\langle p, v \rangle} = \langle \gamma, 0 \rangle$ formally: its path γ is defined on the closed interval $[0, 0]$, i.e. $T = 0$ and $\gamma(0) = p$. We declare this path to be C^1 by convention, and declare its derivative at 0 to be v .
- Given morphisms $\langle \gamma_1, T_1 \rangle : \langle p_1, v_1 \rangle \rightarrow \langle p_2, v_2 \rangle$ and $\langle \gamma_2, T_2 \rangle : \langle p_2, v_2 \rangle \rightarrow \langle p_3, v_3 \rangle$, their composition is $\langle \gamma, T \rangle$ with $T = T_1 + T_2$ and

$$\gamma(t) = \begin{cases} \gamma_1(t) & 0 \leq t \leq T_1 \\ \gamma_2(t - T_1) & T_1 \leq t \leq T_1 + T_2. \end{cases} \quad (5.1)$$

Make a technical sketch of the manifold showing what are the velocities, how do paths look like, etc.

Since we are only amateurs, we don’t feel comfortable with hiking on paths that are too steep in some places. We want to only consider paths that have a certain maximum inclination. Mathematically speaking, for any path – as described by a morphism $\langle \gamma, T \rangle$ in the category **Berg** – we can compute its vertical inclination (vertical slope) and renormalize it to give a number in the interval $(-1, 1)$, say. (Here -1 represents vertical descent, and 1 represents vertical ascent.) Taking absolute values of inclinations – call the resulting quantity “steepness” – we can compute the maximum steepness that a path γ obtains over its domain $[0, T]$. This gives, for every homset $\text{Hom}(\langle p_1, v_1 \rangle, \langle p_2, v_2 \rangle)$, a function

$$\text{MaxSteepness} : \text{Hom}(\langle p_1, v_1 \rangle, \langle p_2, v_2 \rangle) \longrightarrow [0, 1].$$

Now, suppose we decide that we don’t want to traverse paths which have a maximal steepness greater than $1/2$. Paths which satisfy this condition we call *feasible*. Let’s consider only the feasible paths in **Berg**. If we keep the same objects as **Berg**, but only consider feasible path, will the resulting structure still form a category? Should we restrict the set of objects for this to be true? We’ll let you ponder here; this type of question leads to the notion of a *subcategory*, which we’ll introduce soon in a subsequent chapter.

5.3. Generating categories from graphs

Put this section after all concrete examples

To begin, we recall some formal definitions related to (directed) graphs.

Need nice pictures of graphs and various quantities.

Definition 5.3 (Graph). A (directed) *graph* $G = \langle V, A, s, t \rangle$ consists of a set of vertices V , a set of arrows A , and two functions $s, t : A \rightarrow V$, called the *source* and *target* functions, respectively. Given $a \in A$ with $s(a) = v$ and $t(a) = w$, we say that a is an *arrow* from v to w .

Remark 5.4. Both directed graphs and undirected graphs play a prominent role in many kinds of mathematics. In this text, we work primarily with directed graphs and so, from now on, we will drop the “directed”: unless indicated otherwise, the word “graph” will mean “directed graph”.

Definition 5.5 (Path). Let G be a graph. A *path* in G is a sequence of arrows such that the target of one arrow is the source of the next. The *length* of a path is the number of arrows in the sequence. We also formally allow for sequences made up of “zero-many” arrows (such paths therefore have length zero). We call such paths *trivial* or *empty*. If paths describe a journey, then trivial paths correspond to “not going anywhere”. The notions of source and target for arrows extend, in an obvious manner, to paths. For trivial paths, the source and target always coincide.

The following definition provides a way of turning any graph into a category.

Definition 5.6 (Free category on a graph). Let $G = \langle V, A, s, t \rangle$ be a graph. The *free category on G* , denoted $\mathbf{Free}(G)$, has as objects the vertices V of G , and given vertices $x \in V$ and $y \in V$, the morphisms $\mathbf{Free}(G)(x, y)$ are the paths from x to y . The composition of morphisms is given by concatenation of paths, and for any object $x \in V$, the associated identity morphism id_x is the trivial path which starts and ends at x .

Show a picture of a graph and its induced category.

We leave it to the reader to check that the above definition does indeed define a category.

Let's do it ourselves

Exercise 5.7. Consider the following five graphs. For each graph G , how many morphisms in total are there in the associated category $\mathbf{Free}(G)$?



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6. Relation

to write

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6. Relation

6.1. Distribution networks

Consider the type of networks that arise for example in the context of electrical power grids. In a simplified model for a certain region or country, we may have the following kinds of components: power plants (places where electrical power is produced), high voltage transmission lines and nodes, low voltage transmission lines and nodes, and consumers (e.g. homes and businesses). The situation is depicted in Fig. 6.1.

Power Plants	High Voltage Nodes	Low Voltage Nodes	Consumers
Plant 1	HVN 1	LVN 1	C1
	HVN 2	LVN 2	C2
Plant 2	HVN 3	LVN 3	C3
	HVN 4	LVN 4	C4
Plant 3	HVN 5	LVN 5	C5
		LVN 6	C6
		LVN 7	

Figure 6.1.: Components of electrical power grids.

To model the connectivity between the components of the power grid, we now draw arrows between components that are connected. We set the direction of the arrows to flow from energy production, via transmission components, to energy consumption, as depicted in Fig. 6.2.

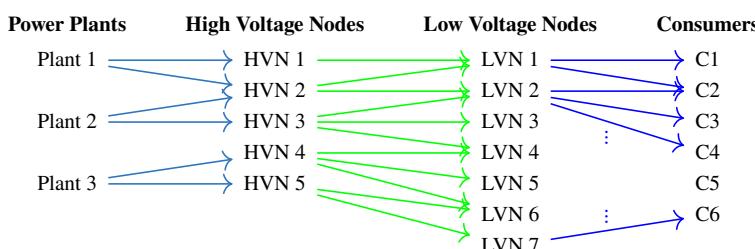


Figure 6.2.: Connectivity between components in electric power grids.

A possible question one asks about such a power distribution network is: which consumers are serviced by which power sources? For example, power sources such as a solar power plant, may fluctuate due to weather conditions, while other power sources, such as a nuclear power plant, may shut down every once in a while due to maintenance work. To see which consumers are connected to which power plants, we can follow paths traced by sequences of arrows, as in Fig. 6.3. There, two possible connectivity paths are depicted (in red and orange, respectively).

We also will want to know the overall connectivity structure of transmission lines. For example, some lines may go down during a storm, and we want to ensure enough redundancy in our system. In addition to the connections modeled in Fig. 6.2, we can also include, for example, information about the connectivity of high voltage nodes among themselves, as in Fig. 6.4.

The information encoded in Fig. 6.4 and Fig. 6.2 can also be displayed as a single graph, see Fig. 6.5, Fig. 6.4. If we ignore the directionality of the arrows, this is analogous to a depiction of type shown in Fig. 6.6, which is a schema of a power grid.¹

¹See https://en.wikipedia.org/wiki/Electrical_grid and <https://doi.org/10.1109/JYST.2015.2427994>

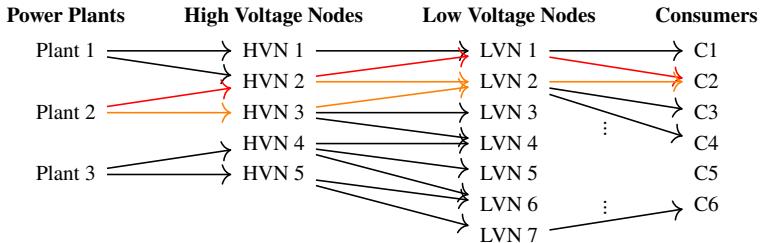


Figure 6.3.: Connection between consumers and power plants.

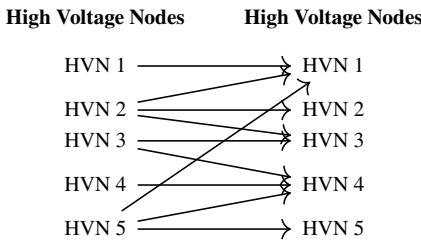


Figure 6.4.: Connectivity between high voltage nodes.

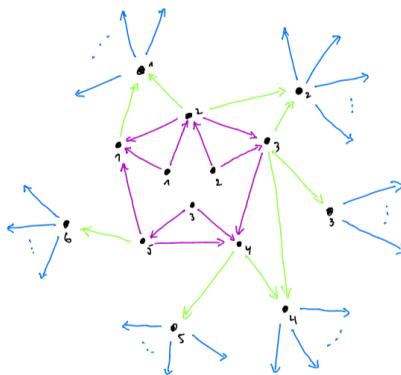


Figure 6.5.: Alternative visualization for connectivity.

6.2. Relations

A basic mathematical notion which underlies the above discussion is that of a **binary relation**.

Definition 6.1 (Binary relation). A *binary relation* from a set X to a set Y is a subset of the Cartesian product $X \times Y$.

Remark 6.2. We will often drop the word “binary” and simply use the name “relation”.

If X and Y are finite sets, we can depict a relation $R \subseteq X \times Y$ graphically as in Fig. 6.7. For each

6. Relation

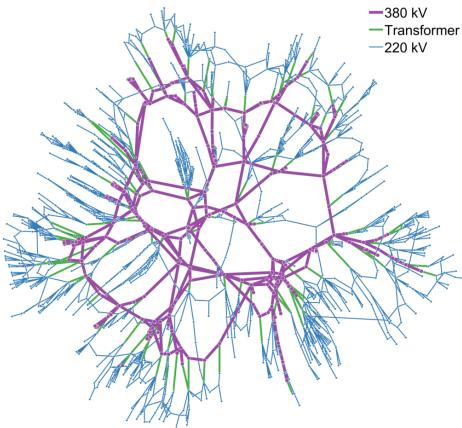


Figure 6.6.: A schematic view of a power grid.

element $\langle x, y \rangle \in X \times Y$, we draw an arrow from x to y if and only if $\langle x, y \rangle \in R \subseteq X \times Y$.

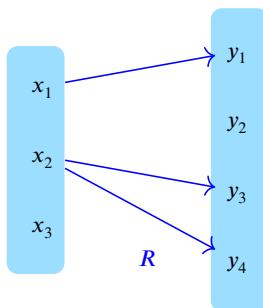


Figure 6.7.

We can also depict this relation graphically as a subset of $X \times Y$ in a “coordinate system way”, as in Fig. 6.8. The shaded grey area is the subset R defining the relation.

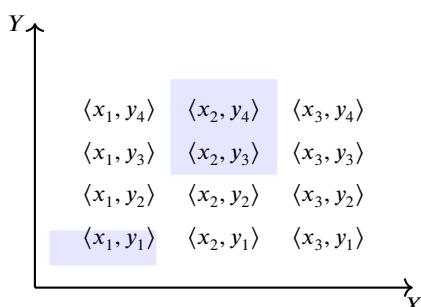


Figure 6.8.: Relations visualized in “coordinate systems”.

Exercise 6.3. Let $X = Y = \{1, 2, 3, 4\}$ and consider the relation $R \subseteq X \times Y$ defined by

$$R = \{\langle x, y \rangle \in X \times Y \mid x \leq y\}. \quad (6.1)$$

Visualize the relation R via the method in Fig. 6.7 and Fig. 6.8 each.

The visualization in Fig. 6.7 hints at the fact that we can think of a relation $R \subseteq X \times Y$ as a *morphism* from X to Y .

Definition 6.4 (Category Rel). The category **Rel** of relations **Rel** is given by:

1. *Objects:* The objects of this category are all sets.
2. *Morphisms:* Given sets X, Y , the homset $\text{Hom}_{\text{Rel}}(X, Y)$ consists of all relations $R \subseteq X \times Y$.
3. *Identity morphisms:* Given a set X , its identity morphism is

$$1_X := \{\langle x, y \rangle \mid x = y\}. \quad (6.2)$$

4. *Composition:* Given relations $R : X \rightarrow Y, S : Y \rightarrow Z$, their composition is given by

$$R ; S := \{\langle x, z \rangle \mid \exists y \in Y : (\langle x, y \rangle \in R) \wedge (\langle y, z \rangle \in S)\}. \quad (6.3)$$

To illustrate the composition rule in Eq. (6.3) for relations, let's consider a simple example, involving sets X, Y , and Z , and relations $R : X \rightarrow Y$ and $S : Y \rightarrow Z$, as depicted graphically below in Fig. 6.9. Now, according to the rule in Eq. (6.3), the composition $R ; S \subseteq X \times Z$ will be such

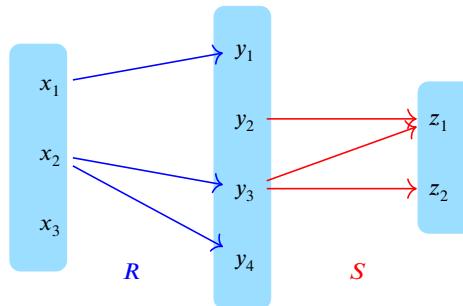


Figure 6.9.: Relations compatible for composition.

that $\langle x, z \rangle \in R ; S$ if and only if there exists some $y \in Y$ such that $\langle x, y \rangle \in R$ and $\langle y, z \rangle \in S$, which, graphically, means that for $\langle x, z \rangle$ to be an element of the relation $R ; S$, x and y need to be connected by at least one sequence of two arrows such that the target of the first arrow is the source of the second. For example, in Fig. 6.9, there is an arrow from x_2 to y_3 , and from there on to z_1 , and therefore, in the composition $R ; S$ depicted in Fig. 6.10, there is an arrow from x_2 to z_1 .

Remark 6.5. Relations with the same source and target can be *compared* via inclusion. Given $R \subseteq X \times Y$ and $R' \subseteq X \times Y$, we can ask whether $R \subseteq R'$ or $R' \subseteq R$.

A question on your mind at this point might be: what is the relationship between relations and functions? One point of view is that functions are special kinds of relations.

Definition 6.6 (Functions as relations). Let X and Y be sets. A relation $R \subseteq X \times Y$ is a **function** if it satisfies the following two conditions:

6. Relation

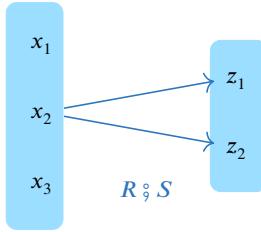


Figure 6.10.: Composition of relations.

1. \$\forall x \in X \quad \exists y \in Y : \langle x, y \rangle \in R\$
2. \$\forall \langle x_1, y_1 \rangle, \langle x_2, y_2 \rangle \in R\$ holds : \$x_1 = x_2 \Rightarrow y_1 = y_2\$.

What does this definition have to do with the “usual” way that we think about functions?

Let start with a relation \$R \subseteq X \times Y\$ satisfying the conditions of Definition 6.6. We’ll build from it a function \$f_R : X \rightarrow Y\$. Choose an arbitrary \$x \in X\$. According to point 1. in Definition 6.6, there exists a \$y \in Y\$ such that \$\langle x, y \rangle \in R\$. So let’s choose such a \$y\$, and call it \$f_R(x)\$. This gives us recipe to get from any \$x\$ to a \$y\$. But maybe you are worried: given a specific \$x \in X\$, what if we choose \$y\$ differently each time we apply the recipe? Point 2. guarantees that this can’t happen: it says that the element \$f_R(x)\$ that we associate to a given \$x \in X\$ is in fact uniquely determined by that \$x\$. Put another way, the condition 2. says: if \$f_R(x_1) \neq f_R(x_2)\$, then \$x_1 \neq x_2\$.

Given a function \$f : X \rightarrow Y\$, we can turn it into a relation in a simple way: we consider its graph

$$R_f := \text{graph}(f) = \{\langle x, y \rangle \in X \times Y \mid y = f(x)\}.$$

The relation \$R_f\$ encodes the same information that \$f\$ encodes – simply in a different form.

In this text, we take Definition 6.6 as our rigorous definition of a what a function is. Nevertheless, we’ll often use functions “in the usual way”, e.g. we’ll write things like \$y = f(x)\$.

Another question you may be wondering about is this: if we define functions as special kinds of relations, how then do we define the composition of functions? The answer is that we compose functions simply by the rule for composing relations.

Lemma 6.7. Let \$R \subseteq X \times Y\$ and \$S \subseteq Y \times Z\$ be relations which are functions. Then their composition \$R ; S \subseteq X \times Z\$ is again a function.

Proof. We check that \$R ; S\$ satisfies the two conditions stated in Definition 6.6.

1. Choose an arbitrary \$x \in X\$. We need to show that there exists \$z \in Z\$ such that \$\langle x, z \rangle \in R ; S\$. Since \$R\$ is a function, there exists \$y \in Y\$ such that \$\langle x, y \rangle \in R\$. Choose such a \$y \in Y\$. Then, because \$S\$ is a function, there exists \$z \in Z\$ such that \$\langle y, z \rangle \in S\$. By the definition of composition of relations, we see that \$z\$ is such that \$\langle x, z \rangle \in R ; S\$.
2. Let \$\langle x_1, z_1 \rangle, \langle x_2, z_2 \rangle \in R ; S\$. We need to show that if \$x_1 = x_2\$, then \$z_1 = z_2\$. So suppose \$x_1 = x_2\$. Since \$\langle x_1, z_1 \rangle, \langle x_2, z_2 \rangle \in R ; S\$, there exist \$y_1, y_2 \in Y\$ such that, respectively,

$$\langle x_1, y_1 \rangle \in R \text{ and } \langle y_1, z_1 \rangle \in S,$$

$$\langle x_2, y_2 \rangle \in R \text{ and } \langle y_2, z_2 \rangle \in S.$$

Since \$x_1 = x_2\$ and \$R\$ is a function, we conclude that \$y_1 = y_2\$ must hold. Now, since \$S\$ is also a function, this implies that \$z_1 = z_2\$, which is what was to be shown.

□

Example 6.8. Can we have a function (or relation) whose source is the empty set \emptyset ? Given any set Y , such a relation would be of the form $R \subseteq \emptyset \times Y := \emptyset$. This implies that $R = \emptyset$. We now need to check whether $R = \emptyset$ corresponds to a function $\emptyset \rightarrow Y$:

- For all $x \in X = \emptyset$, $\exists y \in Y$ such that $\langle x, y \rangle \in R$ (trivially satisfied).
- Clearly, given $\langle x, y \rangle, \langle x', y' \rangle \in R = \emptyset$, having $x = x'$ implies $y = y'$.

Therefore, the answer to the original question is yes.

Example 6.9. Can we have a function (or relation) whose target is the empty set \emptyset ? Again, given any set X , such a relation would be of the form $R \subseteq X \times \emptyset := \emptyset$. This, again, implies $R\emptyset$. We now need to check whether $R = \emptyset$ corresponds to a function $X \rightarrow \emptyset$:

- For all $x \in X$, $\exists y \in Y = \emptyset$ such that $\langle x, y \rangle \in R$? Unless $X = \emptyset$, this is not satisfied.

Therefore, given $X \neq \emptyset$, there is no function (or relation) $X \rightarrow \emptyset$.

Definition 6.10 (Properties of a relation). Let $R \subseteq X \times Y$ be a relation. R is:

1. *Surjective* if $\forall y \in Y \exists x \in X : \langle x, y \rangle \in R$;
2. *Injective* if $\forall \langle x_1, y_1 \rangle, \langle x_2, y_2 \rangle \in R$ it holds: $y_2 = y_1 \Rightarrow x_1 = x_2$;
3. *Defined-everywhere* if $\forall x \in X \exists y \in Y : \langle x, y \rangle \in R$;
4. *Single-valued* if $\forall \langle x_1, y_1 \rangle, \langle x_2, y_2 \rangle \in R$ it holds: $x_1 = x_2 \Rightarrow y_1 = y_2$.

Example 6.11. The relation depicted in Fig. 6.7 is injective but not surjective, i.e. if $\langle x, y \rangle, \langle x', y' \rangle \in R$ and $y = y'$, then $x = x'$.

One can notice a certain duality in the properties listed in Definition 6.10. This is made more precise through the following definition.

Definition 6.12 (Transpose of a relation). Let $R \subseteq X \times Y$ be a relation. The *transpose* (or *opposite*, *reverse*) of R is the relation given by:

$$R^\top := \{ \langle y, x \rangle \in Y \times X \mid \langle x, y \rangle \in R \}.$$

note that $R^\top : Y \rightarrow X$, while $R : X \rightarrow Y$.

Remark 6.13. In the following, we list some properties which refer to relations and their opposites. It is a good exercise to prove them:

- $(R^\top)^\top = R$;
- If R is everywhere-defined, then R^\top is surjective;
- If R is single-valued, then R^\top is injective.
- If R is everywhere defined, then $\text{id}_X \subseteq R \circ R^\top$;
- If R is single-valued, then $R^\top \circ R \subseteq \text{id}_Y$.

Remark 6.14. The aforementioned duality can be seen by “reading the relations (arrows) backwards” (Fig. 6.11).

Definition 6.15 (Endorelation). An *endorelation* on a set X is a relation $R \subseteq X \times X$.

Example 6.16. “Equality” is an endorelation of the form

$$\{ \langle x_1, x_2 \rangle \in X \times X \mid x_1 = x_2 \}.$$

Example 6.17. Take $X = \mathbb{N}$. The relation “less than or equal” is an endorelation of the form

$$\{ \langle m, n \rangle \in \mathbb{N} \times \mathbb{N} \mid m \leq n \}.$$

6. Relation

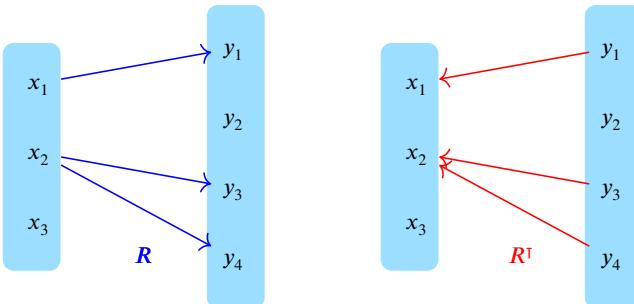


Figure 6.11.

Example 6.18. The relation depicted in Fig. 6.4 is an endorelation between the set of high voltage nodes.

Definition 6.19 (Properties of endorelations). Let $R \subseteq X \times X$ be an endorelation. R is:

- *Symmetric* if $\forall x, x' \in X : \langle x, x' \rangle \in R \Leftrightarrow \langle x', x \rangle \in R$;
- *Reflexive* if $\forall x \in X : \langle x, x \rangle \in R$;
- *Transitive* if $\forall \langle x, x' \rangle \in R$ and $\langle x', x'' \rangle \in R$, we have $\langle x, x'' \rangle \in R$.

Example 6.20. The relation “less than or equal” on \mathbb{N} is not symmetric. It is reflexive since $n \leq n \forall n \in \mathbb{N}$, and it is transitive since $l \leq m$ and $m \leq n$ implies $l \leq n$.

Example 6.21. The relation depicted in Fig. 6.4 is reflexive (each node is connected with itself).

Example 6.22. The endorelation reported in Fig. 6.12 is a symmetric relation on $X = \{x_1, x_2\}$.

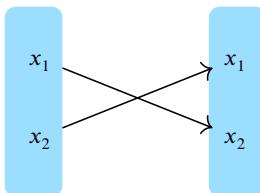


Figure 6.12.: Example of symmetric endorelation.

Definition 6.23 (Equivalence relation). An endorelation $R \subseteq X \times X$ is an *equivalence relation* if it is symmetric, reflexive, and transitive. We write $x \sim x'$ if $\langle x, x' \rangle \in R$.

Example 6.24. The relation “equals” on \mathbb{N} is an equivalence relation. The relation “less than or equal” on \mathbb{N} is not.

Example 6.25. The relation “has the same birthday as” on the set of all people is an equivalence relation. It is symmetric, because if Anna has the same birthday as Bob, then Bob has the same birthday as Anna. It is reflexive because everyone has the same birthday as itself. It is transitive because if Anna has the same birthday as Bob, and Bob has the same birthday as Clara, then Anna has the same birthday as Clara.

Example 6.26. Let $f : X \rightarrow Y$ be a function between sets. The following defines an equivalence relation:

$$x \sim x' \Leftrightarrow f(x) = f(x').$$

Definition 6.27 (Partition). A *partition* of a set X is a collection $\{X_i\}_{i \in I}$ of subsets $X_i \subseteq X$ such that

1. $X_i \cap X_j = \emptyset \quad \forall i \neq j;$
2. $\bigcup_{i \in I} X_i = X.$

Remark 6.28. Equivalence relations are a way to group together elements of a set which we think of as “the same” in some respect. There is a one-to-one correspondence between equivalence relations on a set X and partitions on X .

Example 6.29. An example of partitions can be shown through information networks. An exemplary network is reported in Fig. 6.13. Here, nodes represent data centers, and the arrows represent information flows. We say that data centers x and y are equivalent (i.e., $x \sim y$) if and only if there is a path from x to y and a path from y to x . In this case, we have $a \sim b$, $e \sim d$, and all centers equivalent with themselves.

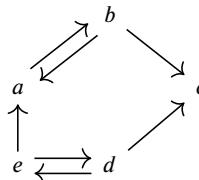


Figure 6.13.

6.3. Relational Databases

A *relational database* like PostgreSQL, MySQL, etc. presents the data to the user as relations. This does not necessarily mean that the data is stored as tuples, as in the mathematical model, but rather that what the user can do is query and manipulate relations. This conceptual model is now 50 years old.

Can we use the category **Rel** to represent databases [[codd2002relational](#)]?

Suppose we want to buy an electric stepper motor for a robot that we are building, and for this we consult a catalogue of electric stepper motors².

The catalogue might be organized as a large table, where on the left-hand side there is a column listing all available motors (identified with a model ID), and the remaining columns correspond to different attributes that each of the models of motor might have, such as the name of the company that manufactures the motor, the size dimensions, the weight, the maximum power, the price, etc. A simple illustration is provided in Table 6.1.

Such database table can be seen as representing an n -ary relation with $n = 7$, as we are expressing a relation over the sets

$$M \times C \times S \times W \times J \times P,$$

²See pololu.com for a standard catalogue of electric stepper motors.

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Motor ID	Company	Size [mm ³]	Weight [g]	Max Power [W]	Cost [USD]
1204	SOYO	20 x 20 x 30	60.0	2.34	19.95
1206	SOYO	28 x 28 x 45	140.0	3.00	19.95
1207	SOYO	35 x 35 x 26	130.0	2.07	12.95
2267	SOYO	42 x 42 x 38	285.0	4.76	16.95
2279	Sanyo Denki	42 x 42 x 31.5	165.0	5.40	164.95
1478	SOYO	56.4 x 56.4 x 76	1,000	8.96	49.95
2299	Sanyo Denki	50 x 50 x 16	150.0	5.90	59.95

Table 6.1.: A simplified catalogue of motors.

where M represents the set of motor IDs, C the set of companies producing motors, S the set of motor sizes, W the set of motor weights, J the set of possible maximal powers, and P the set of possible prices. An n -ary relation is a relation over n sets, just like a binary relation is a relation over 2 sets.

Definition 6.30 (n -ary relation). An n -ary relation on n sets $\langle X_1, X_2, \dots, X_n \rangle$ is a subset of the product set

$$X_1 \times X_2 \times \dots \times X_n.$$

Rel only allows binary relations. Morphisms in **Rel** have 1 source and 1 target. There is no immediate and natural way to represent n -ary relations using **Rel**.

To represent relational databases categorically, there are at least 3 options.

Option 1: Hack it We will introduce the notion of *products* and *isomorphisms*. This will allow us to say that because

$$X_1 \times X_2 \times X_3 \times \dots \times X_n,$$

is isomorphic to

$$X_1 \times (X_2 \times (X_3 \times \dots \times X_n))$$

we can talk about n -ary relations in terms of binary relations. This is not really a natural way to do it.

Option 2: Mutant Morphisms What if morphisms could have more than “two legs”? There are indeed theories that work with more complicated arrows. For example: [multicategories](#), [polycategories](#), [operads](#).

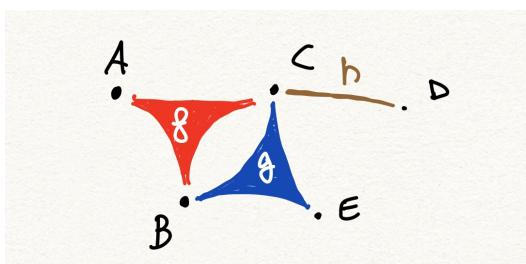


Figure 6.14.: Can you imagine how to define composition with mutant morphisms with more than two legs?

Option 3: Categorical databases A different perspective is that of *categorical databases* [spivak2019cat]. In this modeling framework one does not model the data tables as relations directly. Rather the data is described as a functor from a category representing the schema to **Set**.

6. Relation

7. Computing

to write

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7.1. Databases, sets, functions

In this section, transmuted and transmuter are switched

AC: I'm not sure about this example. I feel that if one is happy with relational databases as a trivial example, they already know Intuitively functions as morphisms (maybe because they know types). If you don't know databases, then that topic cannot be used to introduce a simple concept such as databases.

JL: In the second sentence above, is "that topic" referring to "functions as morphisms"? I'm also not sure if I understand the overall comment. In any case, if it's helpful: the original idea behind this database example was to do things in a way that is compatible with how databases are treated in Seven Sketches. (I'm not necessarily attached to keeping this example, this is just to explain the idea/intention.) I don't know anything about databases anyway :) I just thought it probably works well if it is in line with the FQL way of seeing things.

AC: I propose to have here the **Spreadsheet** category: objects are cells, morphisms are the formulas. There is an object 1 that can be the domain for the constant value of cells.

We continue the discussion of Section 6.3.

In the particular case of tables with primary keys, things are easier. In relational databases, a table column is a primary key if the values of that column are guaranteed to be unique.

If the values in the column are unique, the column serves as the name of the row. In the table above the motor ID serves as the primary key.

Consider a table with columns $P \times X_1 \times X_2 \times \dots \times X_n$, where P is the primary key column. Then, given a key $p \in P$, we can obtain the value in the other columns. We first find the unique row with the key p , and then we read out the values.

Therefore, a table with columns $P \times X_1 \times X_2 \times \dots \times X_n$ can be seen as a tuple $\langle S, \{f_i\}_i \rangle$:

- A subset $A \subseteq P$ that gives us the available keys.
- n read-out functions $f_i : P \rightarrow X_i$, each giving the corresponding value of the i -th attribute.

JL: I don't see yet how the set A comes into play.

GZ:here maybe we don't want color, maybe let's not use transmuted thing?

In this example, we can consider the primary key to be the set

$$M := \{1204, 1206, 1207, 2267, 2279, 1478, 2299\},$$

of models of motors. The other columns are given by the set

$$C := \{\text{SOYO, Sanyo Denki}\}$$

of manufacturing companies, the set S of possible motor sizes, the set W of possible weights, the set J of possible maximal powers, and the set P of possible prices. Each attribute of a motor may be thought of as a function from the set M to set of possible values for the given attribute. For example, there is a function **Company** : $M \rightarrow C$ which maps each model to the corresponding company that manufactures it. So, according to Table 6.1, we have e.g. **Company(1204) = SOYO**, and **Company(2279) = Sanyo Denki**, etc.

Note that in "real life", the catalogue of motors might not have seven entries, as in Table 6.1, but has in fact hundreds of entries, and is implemented digitally as a database, i.e. a collection of interrelated tables. In this case, we will want to be able to search and filter the data based on various criteria. Many natural operations on tables and databases may be described simply in terms of operations with functions. We will use this setting as a way to introduce compositional aspects of working with sets and functions, and a preview of how this might be useful for thinking, in particular, about databases.

Sticking with Table 6.1, suppose, for instance, that we want to consider only motors from Company **Sanyo Denki**. In terms of the function

$$\text{Company} : M \rightarrow C$$

this corresponds to the preimage $\text{Company}^{-1}(\{\text{Sanyo Denki}\}) = \{2279, 2299\}$, which is a subset of the set M . Or, we may want to consider only motors which cost between 40 and 200 USD. In terms of the obvious function

$$\text{Price} : M \rightarrow P,$$

this means we wish to restrict ourselves to the preimage

$$\text{Price}^{-1}(\{49.95, 59.95, 164.95\}) = \{1478, 2299, 2279\} \subseteq M.$$

Now suppose we wish to add a column to our table for “volume”, because we may want to only consider motors that have, at most, a certain volume. For this we define a set V of possible volumes (let's take $V = \mathbb{R}_{\geq 0}$, the non-negative real numbers), and define a function

$$\begin{aligned} \text{Multiply} : S &\rightarrow V \\ \langle l, w, h \rangle &\mapsto l \cdot w \cdot h, \end{aligned}$$

which maps any size of motor to its corresponding volume by multiplying together the given numbers for length, width, and height. Now we can compose this function with the function

$$\text{Size} : M \rightarrow S$$

to obtain a function

$$\text{Volume} : M \rightarrow V,$$

which defines a new column in our table. The composition of functions is usually written as $\text{Volume} = \text{Multiply} \circ \text{Size}$, however we stick to our convention of writing $\text{Volume} = \text{Size} ; \text{Multiply}$. Schematically, we can represent what we did as a diagram (Fig. 7.1).

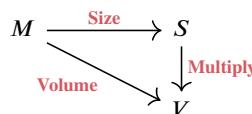


Figure 7.1.: A diagram of functions.

We can interpret arrows in this diagram as being part of a category, where M , S , and V are among the objects, and where the functions **Size**, **Multiply** and **Volume** are morphisms. We probably want to consider the other sets associated with our database as also part of this category, and the other functions which we defined so far, too. One idea might be to just include all the sets and functions that we've defined so far, as well as all possible compositions of those functions, and obtain a category, which we call **Database**, in a way that is similar to how one can build a category from a graph (Section 5.3). This would be an option. However, we may want soon to add new sets and functions to our database framework, or think about new kinds of functions between them that we had not considered before. And we might not want to re-think each time precisely which category we are working with.

7.2. The Category Set

A helpful concept here is to think of our specific sets and functions as living in a very (very) large category which contains all possible sets as its objects and all possible functions as its morphisms. This category is known as the category of sets, and it is an important protagonist in category theory. We will denote it by **Set**. It is a short exercise to check that the following does indeed define a category.

Definition 7.1 (Category of sets). The category of sets **Set** is defined by:

1. *Objects*: all sets.
2. *Morphisms*: given sets X and Y , the homset $\text{Hom}_{\text{Set}}(X, Y)$ is the set of all functions from X to Y .
3. *Identity morphism*: given a set X , its identity morphism id_X is the identity function $X \rightarrow X$, $\text{id}_X(x) = x$.
4. *Composition operation*: the composition operation is the usual composition of functions.

We did say above, however, that we could build a category **Database** which only involves the sets that we are using for our database, and the functions between them that we are working with. What we would need for **Database** to be a category is that if any function is in **Database**, then also its sources and target sets are, and we would need that any composition of functions in **Database** is again in **Database**. (Also, we define the identity morphism for any set in **Database** to be the identity function on that set.) If these conditions are met, **Database** is what is called a *subcategory* of **Set**.

7.3. Propositions

Define the category of propositions where objects are propositions and morphisms are proofs.
Also use to introduce the sequent notations

8. Specialization

to write

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8. Specialization

8.1. Notion of subcategory

Definition 8.1 (Subcategory). A *subcategory* \mathbf{D} of a category \mathbf{C} is a category for which:

1. All the objects in $\text{Ob}_{\mathbf{D}}$ are in $\text{Ob}_{\mathbf{C}}$;
2. For any objects $X, Y \in \text{Ob}_{\mathbf{D}}$, $\text{Hom}_{\mathbf{D}}(X, Y) \subseteq \text{Hom}_{\mathbf{C}}(X, Y)$;
3. If $X \in \text{Ob}_{\mathbf{D}}$, then $\text{id}_X \in \text{Hom}_{\mathbf{C}}(X, X)$ is in $\text{Hom}_{\mathbf{D}}(X, X)$ and acts as its identity morphism;
4. If $f : X \rightarrow Y$ and $g : Y \rightarrow Z$ in \mathbf{D} , then the composite $f \circ g$ in \mathbf{C} is in \mathbf{D} and represents the composite in \mathbf{D} .

Two important examples of subcategory are the following.

Example 8.2 (Finite Sets). \mathbf{FinSet} is the category of finite sets and all functions between them. It is a subcategory of the category \mathbf{Set} of sets and functions. While an object $X \in \text{Ob}_{\mathbf{Set}}$ is a set with arbitrary cardinality, $\text{Ob}_{\mathbf{FinSet}}$ only includes sets which have finitely many elements. Objects of \mathbf{FinSet} are in \mathbf{Set} , but the converse is not true. Furthermore, given $X, Y \in \text{Ob}_{\mathbf{FinSet}}$, we take $\text{Hom}_{\mathbf{FinSet}}(X, Y) = \text{Hom}_{\mathbf{Set}}(X, Y)$.

Example 8.3 (\mathbf{Set} and \mathbf{Rel}). The category \mathbf{Set} is a subcategory of \mathbf{Rel} . To show this, we need to prove the conditions presented in Definition 8.1.

1. In both \mathbf{Rel} and \mathbf{Set} , the collection of objects is all sets.
2. Given $X, Y \in \text{Ob}_{\mathbf{Set}}$, we know that $\text{Hom}_{\mathbf{Set}}(X, Y) \subseteq \text{Hom}_{\mathbf{Rel}}(X, Y)$, i.e., that all functions between sets X, Y are a particular subset of all relations between X, Y .
3. For each $X \in \text{Ob}_{\mathbf{Set}}$, the identity relation $\text{id}_X = \{(x, x') \in X \times X \mid x = x'\}$ corresponds to the identity function $\text{id}_X : X \rightarrow X$ in \mathbf{Set} .
4. Let $R \subseteq X \times Y$ and $S \subseteq Y \times Z$ be relations which are functions. We need to show that their composition in \mathbf{Rel} , expressed as $R ; S \subseteq X \times Z$, is again a function. This was proven in Lemma 6.7.

8.2. Drawings

Definition 8.4 (Drawings). There exists a category \mathbf{Draw} in which:

1. An object in $\alpha \in \text{Ob}_{\mathbf{Draw}}$ is a black-and-white drawing, that is a function $\alpha : \mathbb{R}^2 \rightarrow \mathbf{Bool}$.
2. A morphism in $\text{Hom}_{\mathbf{Draw}}(\alpha, \beta)$ between two drawings α and β is an invertible map $f : \mathbb{R}^2 \rightarrow \mathbb{R}^2$ such that $\alpha(x) = \beta(f(x))$.
3. The identity function at any object α is the identity map on \mathbb{R}^2 .
4. Composition is given by function composition.

Exercise 8.5. Check whether just considering

- affine invertible transformations, or
- rototranslations, or
- scalings, or
- translations, or
- rotations,

as morphisms forms a subcategory of \mathbf{Draw} .

Add a few figures here.

We can now think about the different types of transformations.

- **Scalings.** Let $s, t \in \mathbb{R}$. Scalings can be represented as functions of the form

$$\begin{aligned} f_{s,t} : \mathbb{R}^2 &\rightarrow \mathbb{R}^2 \\ \langle x, y \rangle &\mapsto \langle sx, ty \rangle, \end{aligned}$$

- **Translations.** Let $s, t \in \mathbb{R}$. Translations are functions of the form

$$\begin{aligned} f_{s,t} : \mathbb{R}^2 &\rightarrow \mathbb{R}^2 \\ \langle x, y \rangle &\mapsto \langle x + s, y + t \rangle. \end{aligned}$$

- **Rotations.** Let $\theta \in [0, 2\pi)$. Rotations are functions of the form

$$\begin{aligned} f_\theta : \mathbb{R}^2 &\rightarrow \mathbb{R}^2 \\ \langle x, y \rangle &\mapsto \langle x \cos(\theta) + y \sin(\theta), y \cos(\theta) - x \sin(\theta) \rangle. \end{aligned}$$

- ...

Finish the above, show which ones are subcategories, etc.

8.3. Other examples of subcategories in engineering

In engineering it is very common to look at specific types of functions; in many cases, the properties of a certain type of function are preserved by function composition, and so they form a category.

InjSet forms a subcategory of Set

Definition 8.6 (Injective function). Let $f : X \rightarrow Y$ be a function. The function f is *injective* if, for all $x, x' \in X$ holds: $f(x) = f(x') \implies x = x'$.

Example 8.7. We can define a category **InjSet** which has the same objects as **Set** but restricts the morphisms to be *injective functions*. We want to show that **InjSet** is a subcategory of **Set**. Composition and identity morphisms are defined as in **Set**.

Since $\text{Ob}_{\text{InjSet}} = \text{Ob}_{\text{Set}}$, the first condition of Definition 8.1 is satisfied. Injective functions are a particular type of functions: this satisfies the second condition. Given $X \in \text{Ob}_{\text{InjSet}}$, the identity morphism $\text{id}_X \in \text{Hom}_{\text{Set}}(X, X)$ corresponds to the identity morphism in $\text{Hom}_{\text{InjSet}}(X, X)$, i.e., the identity function is injective. This proves the third condition. To check the fourth condition, consider two morphisms $f \in \text{Hom}_{\text{Set}}(X, Y)$, $g \in \text{Hom}_{\text{Set}}(Y, Z)$ such that $f \in \text{Hom}_{\text{InjSet}}(X, Y)$ and $g \in \text{Hom}_{\text{InjSet}}(Y, Z)$. From the injectivity of f, g , we know that given $x, x' \in X$, $f(x) = f(x') \Leftrightarrow x = x'$ and $y, y' \in Y$, $g(y) = g(y') \Leftrightarrow y = y'$. Furthermore, we have:

$$\begin{aligned} (f \circ g)(x) = (f \circ g)(x') &\implies f(x) = f(x') \\ &\implies x = x', \end{aligned}$$

which proves the fourth condition of Definition 8.1, i.e. that the composition of injective functions is injective.

Definition 8.8 (Continuous functions). Let $f : \mathbb{R} \rightarrow \mathbb{R}$ be a function. We call f *continuous* at $c \in \mathbb{R}$ if $\lim_{x \rightarrow c} f(x) = f(c)$; f is continuous over \mathbb{R} if the condition is satisfied for all $c \in \mathbb{R}$.

Example 8.9. We can define a category **Cont** which $\text{Ob}_{\text{Cont}} = \mathbb{R}$ and in which the morphisms are given by continuous functions. Composition and identity are as in **Set**. We want to show that **Cont** is a subcategory of **Set**.

write down formally and use that composition of continuous is continuous

8. Specialization

Continuous functions (topologies)

Differentiable functions: Set to Manifolds

Definition 8.10 (Differentiable functions). A function $f : U \subset \mathbb{R} \rightarrow \mathbb{R}$, defined on an open set U , is *differentiable* at $a \in U$ if the derivative

$$f'(a) = \lim_{h \rightarrow 0} \frac{f(a+h) - f(a)}{h} \quad (8.1)$$

exists; f is differentiable on U if it is differentiable at every point of U .

Example 8.11. the composition of differentiable functions is differentiable

Lipschitz bounded

Definition 8.12 (Lipschitz continuous function). A real valued function $f : \mathbb{R} \rightarrow \mathbb{R}$ is called *Lipschitz* continuous if there exists a positive real constant κ such that, for all $x_1, x_2 \in \mathbb{R}$:

$$|f(x_1) - f(x_2)| \leq \kappa|x_1 - x_2|. \quad (8.2)$$

Example 8.13. the composition of differentiable functions is differentiable

smooth

cont diff, composition is compdiff

Generalization outside of \mathbb{R}

Generalization to more general spaces. We used the fact that \mathbb{R} is:

- For defining continuous functions, we used the fact that \mathbb{R} is topological space (minimum needed for defining a continuous function.). In fact, the real definitioin of continuous function is:
ADD: continuous function
- To define Lipschitz we needed the fact that \mathbb{R} is a metric space
- For differentiable, smooth, you define this on Manifolds. Exists tangent space.

Hence in general, the objects of these are different, so it's not really a relation of subcategory, that requires the objects to be the same. However we will see later that you can generalize this notion using functors.

functor $F:C \rightarrow D$ that is both injective on objects and a faithful functor.

8.4. Subcategories of **Berg**

Recall the category **Berg** presented in Section 5.2. In the following, we want to give both a positive and a negative example of subcategories related to **Berg**.

We first start our discussion by introducing an *amateur* version of **Berg**, called **BergAma**, which only considers paths (morphisms) in **Berg**, whose steepness does not exceed a critical value, say 1/2. Is **BergAma** a subcategory of **Berg**? Let's check the different conditions:

1. The constraint on the maximum steepness restricts the objects which are acceptable in **BergAma** via the identity morphisms of **Berg**. Indeed, recall that given an object $\langle p, v \rangle \in \text{Ob}_{\text{Berg}}$, the identity morphism is defined as $1_{\langle p, v \rangle} = \langle \gamma, 0 \rangle$, with $\gamma(0) = p$ and $\dot{\gamma}(0) = v$. The steepness is computed via v . In particular, **BergAma** will only contain objects whose identity morphisms do not exceed the steepness constraint, i.e. $\text{Ob}_{\text{BergAma}} \subseteq \text{Ob}_{\text{Berg}}$.
2. For $A, B \in \text{Ob}_{\text{BergAma}}$, we know that paths satisfying the steepness constraint are specific paths in **Berg**, i.e. $\text{Hom}_{\text{BergAma}} \subseteq \text{Hom}_{\text{Berg}}$.
3. The identity morphisms in **Berg** which satisfy the steepness constraint are, by definition, in **BergAma** and they act as identities there.
4. Given two morphisms f, g which can be composed in **BergAma**, the maximum steepness of their composition $f \circ g$ is given by:

$$\text{MaxSteepness}(f \circ g) = \max \{ \text{MaxSteepness}(f), \text{MaxSteepness}(g) \} < 1/2.$$

This shows that **BergAma** is a subcategory of **Berg**. What would an example of non-subcategory of **Berg** be? Let's define a new category **BergLazy**, which now discriminates morphisms based on the lengths of the paths they represent. For instance, assume that as amateur hikers, we don't want to consider morphisms which are more than 1 km long. By concatenating two paths (morphisms) of length 0.6 km in **BergLazy**, the resulting composition will be 1.2 km, violating the posed constraint and hence not being in **BergLazy**. This violates the fourth property of Definition 8.1.

8. Specialization

9. Sameness

to write

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9. Sameness

9.1. Sameness in category theory

One nice thing about the category of sets is that we are all used to working with sets and functions. And many concepts that are familiar in the setting of sets and functions can actually be reformulated in a way which makes sense for lots of other categories, if not for all categories. It can be fun, and insightful, to see known definitions transformed into “category theory language”. For example: the notion of a bijective function is a familiar concept. There are least two ways of saying what it means for a function $f : X \rightarrow Y$ of sets to be bijective:

Definition 1: “ $f : X \rightarrow Y$ is bijective if, for every $y \in Y$ there exists precisely one $x \in X$ such that $f(x) = y$;

Definition 2: “ $f : X \rightarrow Y$ is bijective if there exists a function $g : Y \rightarrow X$ such that $f \circ g = \text{id}_X$ and $g \circ f = \text{id}_Y$ ”.

It is a short proof to show that the above two definitions are equivalent. The first definition, however, does not lend itself well to generalization in category theory, because it is formulated using something that is very specific to sets: namely, it refers to *elements* of the sets X and Y . And we have seen that the objects of a category need not be sets, and so in general we cannot speak of “elements” in the usual sense. Definition 2, on the other hand, can easily be generalized to work in any category. To formulate this version, all we need are morphisms, their composition, the notion of identity morphisms, and the notion of equality of morphisms (for equations such as “ $f \circ g = \text{id}_x$ ”). The generalization we obtain is the fundamental notion of an “isomorphism”.

Definition 9.1 (Isomorphism). Let \mathbf{C} be a category, let $X, Y \in \mathbf{C}$ be objects, and let $f : X \rightarrow Y$ be a morphism. We say that f is an *isomorphism* if there exists a morphism $g : Y \rightarrow X$ such that $f \circ g = \text{id}_X$ and $g \circ f = \text{id}_Y$.

Remark 9.2. The morphism g in the above definition is called the **inverse** of f . Because of the symmetry in how the definition is formulated, it is easy to see that g is necessarily also an isomorphism, and its inverse is f .

Exercise 9.3. In Remark 9.2 we wrote *the* inverse. We do this because inverses are in fact unique. Can you prove this? That is, show that if $f : X \rightarrow Y$ is an isomorphism, and if $g_1 : Y \rightarrow X$ and $g_2 : Y \rightarrow X$ are morphisms such that $f \circ g_1 = \text{id}_X$ and $g_1 \circ f = \text{id}_Y$, and $f \circ g_2 = \text{id}_X$ and $g_2 \circ f = \text{id}_Y$, then necessarily $g_1 = g_2$.

Definition 9.4 (Isomorphic). Let \mathbf{C} be a category, and let $X, Y \in \mathbf{C}$ be objects. We say that X and Y are **isomorphic** if there exists an isomorphism $X \rightarrow Y$ or $Y \rightarrow X$.

For the formulation of the definition of “isomorphic”, mathematicians might often only require the existence of an isomorphism $X \rightarrow Y$, say, since by Remark 9.2 we know there is then necessarily also an isomorphism in the opposing direction, namely the inverse. We choose here the longer, perhaps more cumbersome formulation just to emphasize the symmetry of the term “isomorphic”. Also note that the definition leaves unspecified whether there might be just one or perhaps many isomorphisms $X \rightarrow Y$.

When two objects are isomorphic, in some contexts we will want to think of them as “the same”, and in some contexts we will want to keep track of more information. In fact, in category theory, it is

typical to think in terms of different kinds of “sameness”. To give a sense of this, let’s look at some examples using sets.

Example 9.5 (Semantic coherence). Suppose Francesca and Gabriel want to share a dish at a restaurant. Francesca only speaks Italian, and Gabriel only speaks German. Let M denote the set of dishes on the menu. For each dish, Francesca can say if she is willing to eat it, or not. This can be modeled by a function $f : M \rightarrow \{\text{Si, No}\}$ which maps a given dish $m \in M$ to the statement “Si” (yes, I’d eat it) or “No” (no, I wouldn’t eat it). Gabriel can do similarly, and this can be modeled as a function $g : M \rightarrow \{\text{Ja, Nein}\}$. Then, the subset of dishes of M that both Francesca and Gabriel are willing to eat (and thus able to share) is

$$\{m \in M \mid f(m) = \text{Si} \quad \text{and} \quad g(m) = \text{Ja}\}.$$

Suppose the server at the restaurant knows no Italian and no German. To help with the situation, he introduces a new two-element set: $\{\heartsuit, \clubsuit\}$. Then Francesca and Gabriel can each map their respective positive answers (“Si” and “Ja”) to “ \heartsuit ”, and their respective negative answers to “ \clubsuit ”. This defines isomorphisms

$$\{\text{Si, No}\} \longleftrightarrow \{\heartsuit, \clubsuit\} \longleftrightarrow \{\text{Ja, Nein}\}$$

whose compositions provide a translation between the Italian and German two-element sets. Using these isomorphisms, we obtain, by composition, new functions

$$\tilde{f} : M \longrightarrow \{\heartsuit, \clubsuit\}, \quad \tilde{g} : M \longrightarrow \{\heartsuit, \clubsuit\},$$

and the set of dishes that Francesca and Gabriel would be willing to share can be written as

$$\{m \in M \mid \tilde{f}(m) = \heartsuit \quad \text{and} \quad \tilde{g}(m) = \heartsuit\}.$$

This may all seem unnecessarily complicated. The main point of this example is the following. There are infinitely many two-element sets; commonly used ones might be, for example

$$\{0, 1\}, \{\text{true, false}\}, \{\perp, \top\}, \{\text{left, right}\}, \{-, +\}, \text{etc.}$$

They are all isomorphic (for any two such sets, there are precisely two possible isomorphisms between them) and we can in principle use any one in place of another. However, in most cases, we should keep precise track of the semantics of what each of the two elements mean in a given context, i.e. how they are being used in interaction with other mathematical constructs.

Example 9.6 (Sizes). Suppose we are a manufacturer and we are counting how many wheels are in a certain warehouse. If W denotes the set of wheels that we have, then counting can be modelled as a function $f : W \rightarrow \mathbb{N}$ to the natural numbers. If we find that there are, say, 273 wheels, then our counting procedure gives us a bijective function from W to the set $\{1, 2, 3, \dots, 272, 273\}$. In this case, we don’t care which specific wheel we counted first, second, or last. We could just as well have counted in a different order, which would amount to a different function $f' : W \rightarrow \mathbb{N}$. The only thing we care about is the fact that the sets W and $\{1, 2, 3, \dots, 272, 273\}$ are *isomorphic*; we don’t need to keep track of which counting isomorphism exhibits this fact.

Example 9.7 (Relabelling). Consider the little catalogue in Table 6.1. Suppose that your old way of listing models of motors has become outdated and you need to change to a new system, where each model is identified, say, by a unique numerical 10-digit code. Relabelling each of the models with its numerical code corresponds to an isomorphism, say *relabel*, from the new set N of numerical codes to the old set M of model names. In contrast to the previous example, however, it is of course absolutely necessary to keep track of the isomorphism *relabel* that defines the relabelling. This is what holds the information of which code denotes which model.

9. Sameness

Note also that all the other labelling functionalities in our example database may be updated by precomposing with relabel. For example, the old “Company” label was described by a function

$$\text{Company} : M \rightarrow C.$$

The updated version of the “Company” label, using the new set N of model IDs, is obtained by the composition

$$N \xrightarrow{\text{relabel}} M \xrightarrow{\text{Company}} C.$$

Example 9.8. Going back to currency exchangers, recall that any currency exchanger $E_{a,b}$, given by

$$E_{a,b} : \mathbb{R} \times \{\text{USD}\} \rightarrow \mathbb{R} \times \{\text{EUR}\}$$
$$\langle x, \text{USD} \rangle \mapsto \langle ax - b, \text{EUR} \rangle$$

is an isomorphism, since one can define a currency exchanger $E_{a',b'}$ such that

$$E_{a,b} \circ E_{a',b'} = E_{a',b'} \circ E_{a,b} = E_{1,0}.$$

Example 9.9. In **FinSet**, isomorphisms from a set to itself are automorphisms, and correspond to *permutations* of the set. Assuming a cardinality of n for the set (i.e., the set has n elements), the number of isomorphisms is given by the number of ways in which one can “rearrange” n elements of the set, which is $n!$.

Example 9.10. In **Set**, isomorphisms between $\mathbb{R} \rightarrow \mathbb{R}$ correspond to invertible functions.

9.2. Isomorphism is not identity

Example 9.11. Let’s consider currencies, and in particular the sets $\mathbb{R} \times \{\text{USD}\}$ and $\mathbb{R} \times \{\text{USD cents}\}$. These are both objects of the category **Curr** and are isomorphic. Being isomorphic does not mean to be strictly “the same”. Indeed, even if the amounts correspond, 10 **USD** and 1,000 **USD cents** are different elements of different sets, but there exists an isomorphism between the two. For one direction, the isomorphism transforms **USD** into **USD cents** (multiplying the real number by 100); the other direction transforms **USD cents** into **USD** (dividing the real number by 100).

Invertible functions are isomorphisms

Strictly monotone functions are invertible from \mathbb{R} to \mathbb{R} ?

isomorphisms in 2D

isomorphisms are permutations

Examples from before: Dynamical systems (open, $d=0$). Objects are sets, morphisms given by state update and readout. Can go back and forth. (category of processes in computer science)

10. Universal properties

to write

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move universal properties somewhere else

10.1. Universal properties

JL: I think this might be a good place to introduce universal properties via initial and terminal objects (and in particular using the examples of Set and Rel)

Definition 10.1 (Initial and terminal object). Let \mathbf{C} be a category and let $A \in \mathbf{C}$ be an object. We say that A is an *initial object* if, for all $B \in \mathbf{C}$, the hom-set $\text{Hom}_{\mathbf{C}}(A, B)$ has exactly one element. We say that A is a *terminal object* if, for all $D \in \mathbf{C}$, the hom-set $\text{Hom}_{\mathbf{C}}(D, A)$ has exactly one element.

11. Trade-offs

to write

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11. Trade-offs

11.1. Trade-offs

Add the examples from session 6:

Trade-offs characterize all engineering disciplines, and can be literally found everywhere. A typical trade-off is the one reported in Fig. 11.1. When designing a product, you want it to be *good*, *fast*, and *cheap*, and typically you can just choose between two of these qualities.

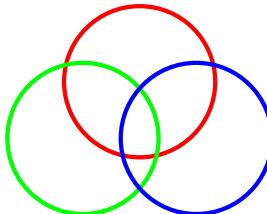


Figure 11.1.

finish example

Functionality, requirements, 3 types of achievable accuracy plots

example: Trade-offs for the human body

example: Masks

example: Hats and headphones

11.2. Ordered sets

So far, the discussion has been purely qualitative. While we discussed how categories can describe the way in which one resource can be turned into another, this kind of modelling did not allow for quantitative statements. For example, it is good to know that we can obtain motion from electric power, but, how fast can we go with a certain amount of power?

To achieve a quantitative theory, we need to specify various degrees of resources and functionality. One way of doing this, is through the idea of partial orders.

Such orderings arise naturally in engineering as criteria for judging whether one design is better or worse than another. As an example, suppose you need to prepare some pizza, i.e., you have to buy specific ingredients and cook them, using a recipe you decide to follow. In this simple example, you can think of having two resources: time and money. A quicker recipe might include more expensive ingredients, and a slower recipe could feature more affordable ones. How to choose among recipes, if you do not prefer one resource over the other? How to model this? In this section, we will assume that functionality and resources are *partially-ordered sets (posets)*.

Davey and Priestley [[davey02](#)] and Roman [[roman08](#)] are possible reference texts.

Introduce at the same time pre-order, poset, total order, like in slides.

Remark: add remark about more general preference functions (Semiorder etc.)

Definition 11.1 (Partially ordered set). A *partially-ordered set (poset)* is a tuple $\langle P, \leq \rangle$, where P is a set (also called the *carrier set*), together with a relation \leq on P that is

1. *Reflexive*: For all $x \in P$, $x \leq x$.
2. *Antisymmetric*: For all $x, y \in P$, if $x \leq y$ and $y \leq x$, then $x = y$.
3. *Transitive*: For all $x, y, z \in P$, if $x \leq y$ and $y \leq z$, then $x \leq z$.

A *Hasse diagram* is an economical (in terms of arrows) way to visualize a poset. In a Hasse diagram elements are points, and if $x \leq y$ then x is drawn lower than y and with an edge connected to it, if no other point is in between. Hasse diagrams are directed graphs.

In the example of the pizza recipes, both time and money can be thought of as partially ordered sets $\langle \mathbb{R}_{\geq 0}, \leq \rangle$. Imagine that you have recipes costing 1 **USD**, 2 **USD**, and 3 **USD**. This can be represented as in Fig. 11.2.



Figure 11.2.: The cost of pizza ingredients can be represented as a poset.

Example 11.2. Consider a poset $P = \{a, b, c, d, e\}$ with $a \leq b$, $a \leq c$, $d \leq c$, and $d \leq e$. This can be represented with a Hasse diagram as in Fig. 11.3.

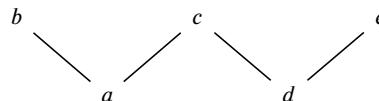


Figure 11.3.: Example of Hasse diagram of P .

Example 11.3 (Singleton poset). If a set has only one element, say $\{1\}$, then there is a unique order relation on it (Fig. 11.4). We denote the resulting poset again by $\{1\}$.



Figure 11.4.: The singleton poset.

Example 11.4. In this example, we represent all posets up to isomorphisms on up to 4 elements. For one element, one has only the singleton poset (Fig. 11.4). On 2-elements sets, one has the posets reported in Fig. 11.5. On 3-elements sets, one has the posets reported in Fig. 11.6. On 4-elements sets, one has the posets reported in Fig. 11.7.

Example 11.5 (Booleans). The booleans is a poset with carrier set $\{\top, \perp\}$ and the order relation given by $b_1 \leq_{\text{Bool}} b_2$ iff $b_1 \Rightarrow b_2$, that is, $\perp \leq_{\text{Bool}} \top$ (Fig. 11.8).

This relation should be familiar from Table 11.1.

11. Trade-offs



Figure 11.5.: All posets on 2-elements sets, up to isomorphisms.

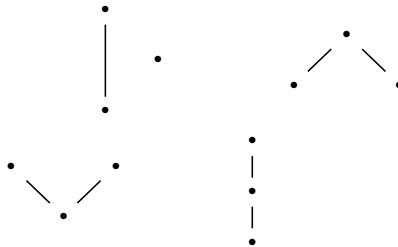


Figure 11.6.: All posets on 3-elements sets, up to isomorphisms.

a	b	$a \leq_{\text{Bool}} b$	$a \wedge b$	$a \vee b$
T	T	T	T	T
T	⊥	⊥	⊥	T
⊥	T	T	⊥	T
⊥	⊥	T	⊥	⊥

Table 11.1.: Properties of the **Bool** poset.

In addition to the operation

$$\Rightarrow : \text{Bool} \times \text{Bool} \rightarrow \text{Bool},$$

called *implies*, there are also the familiar *and* (\wedge) and *or* (\vee) operations. Note that \wedge and \vee are commutative ($b \wedge c = c \wedge b$, $b \vee c = c \vee b$), whereas \Rightarrow is not.

Example 11.6 (Reals). The real numbers \mathbb{R} form a poset with carrier \mathbb{R} and order relation given by the usual ordering $r_1 \leq r_2$.

Example 11.7 (Discrete partially ordered sets). Every set X can be considered as a *discrete poset* $\langle X, = \rangle$. Discrete posets are represented as collection of points (Fig. 11.9).

Example 11.8. Given a set $X = \{a, b, c\}$, consider its power set $\mathcal{P}(X)$. Define sets as the objects of this new category and define the morphisms to be inclusions (Fig. 11.10).

The identity morphism of each set is the inclusion with itself (every set is a subset of itself). Composition is given by composition of inclusions, i.e., if $X \subseteq Y \subseteq Z$, then $X \subseteq Z$.

A note on preorders

Definition 11.9 (Preorder). A *preorder* is a tuple $\langle P, \leq \rangle$, where P is a set (also called the *carrier set*), together with a relation \leq on P that is

1. *Reflexive*: For all $x \in P$, $x \leq x$.
2. *Transitive*: For all $x, y, z \in P$, if $x \leq y$ and $y \leq z$, then $x \leq z$.

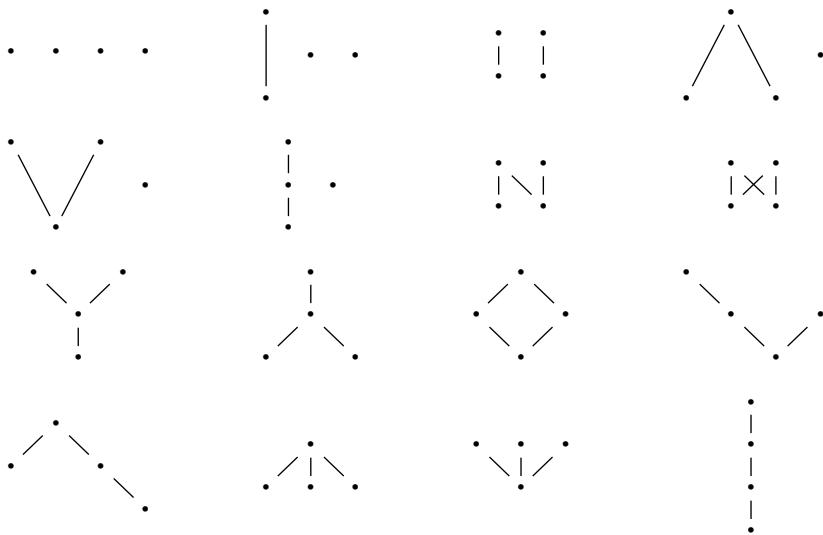


Figure 11.7.: All posets on 4-elements sets, up to isomorphisms.

$$\begin{array}{c} \top \\ | \leq \\ \perp \end{array}$$

Figure 11.8.

The theory of design problems can be easily generalized to preorders. This means that there could be two elements x and y such that $x \leq y$ and $x \geq y$ but $x \neq y$ (Fig. 11.11).

This is actually common in practice. For example, if the order relation comes from human judgement, such as customer preference, all bets are off regarding the consistency of the relation. We will only refer to posets for two reasons:

1. The exposition is smoother.
2. Given a preorder, computation will always involve passing to the poset representation.

This means that, given a preorder, we can consider the poset of its isomorphism classes, by means of the following equivalence relation:

$$x \simeq y \quad \equiv \quad (x \leq y) \wedge (y \leq x). \quad (11.1)$$

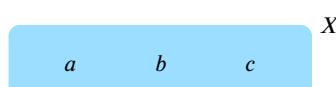


Figure 11.9.: Example of a discrete poset.

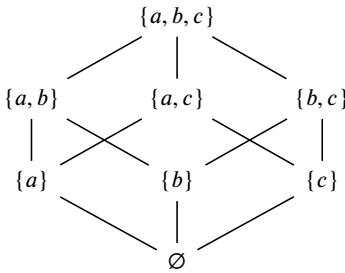
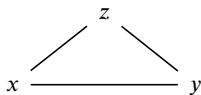


Figure 11.10.: Power set as a category.



Let's not use Hasse for preorders, it's not a thing.

Figure 11.11.: Example of a preorder.

11.3. Chains and Antichains

This part is partially repeated from above. Do chains, antichains, upper/lower sets before "poset as a category".

Definition 11.10 (Chain in a poset). Given a poset S , a *chain* is a sequence of elements s_i in S where two successive elements are comparable, i.e.:

$$i \leq j \Rightarrow s_i \leq s_j. \quad (11.2)$$

Definition 11.11 (Antichain in a poset). An *antichain* is a subset S of a poset where no elements are comparable. If $a, b \in S$, then $a \leq b$ implies $a = b$.

Remark 11.12. We denote the set of antichains of a poset P by \mathcal{AP} .

Remark 11.13. Note that given a poset $\langle P, \leq \rangle$, $\emptyset \in \mathcal{AP}$ since \emptyset contains no elements (and hence no comparable elements).

In the context of pizza recipes, consider the diagram reported in Fig. 11.12. The blue points represent an antichain of recipes $\{\langle 1 \text{ USD}, 2 \text{ h} \rangle, \langle 2 \text{ USD}, 1 \text{ h} \rangle\}$, i.e. recipes which do not dominate each other (one is cheaper but takes longer and the other is more expensive but quicker). The red point represents a recipe which cannot be part of the antichain, since it is dominated by $\langle 2 \text{ USD}, 1 \text{ h} \rangle$.

Example 11.14. Let's consider the poset $\langle P, \leq \rangle$ where $a \leq b$ if a is a divisor of b and $P = \{1, 5, 10, 11, 13, 15\}$. A chain of P is $\{1, 5, 10, 15\}$. An antichain of P is $\{10, 11, 13\}$.

Example 11.15. Consider Example 11.8. Examples of chains are

$$\{\emptyset, \{a\}, \{a, b\}, \{a, b, c\}\}, \quad \{\emptyset, \{b\}, \{b, c\}, \{a, b, c\}\}. \quad (11.3)$$

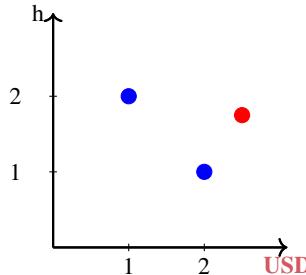


Figure 11.12.: Example of an antichain of pizza recipes.

Examples of antichains are

$$\{\{a\}, \{b\}, \{c\}\}, \quad \{\{a, b\}, \{a, c\}, \{b, c\}\}. \quad (11.4)$$

Example 11.16. Suppose you have to choose a battery model based on its cost and its weight, both to be minimized. There may be models which dominate others. For instance, a model $\langle 10 \text{ USD}, 1 \text{ kg} \rangle$ is better than a model $\langle 11 \text{ USD}, 1.1 \text{ kg} \rangle$. Also, there may be models which are incomparable, i.e. which form an antichain. For example, you cannot say whether $\langle 10 \text{ USD}, 1 \text{ kg} \rangle$ is better than $\langle 5 \text{ USD}, 2 \text{ kg} \rangle$. The incomparable models form an antichain.

11.4. Upper and lower sets

Definition 11.17 (Upper set). An *upper set* is a subset U of a poset P such that, if an element is inside, all elements above it are inside as well. In formulas:

$$U \text{ is an upperset} \equiv \forall x \in U, \forall y \in P : x \leq y \Rightarrow y \in U. \quad (11.5)$$

Remark 11.18. We call UP the set of upper sets of P .

Definition 11.19 (Lower set). A *lower set* is a subset L of a poset P if, if a point is inside, all points below it are inside as well. In formulas:

$$L \text{ is a lower set} \equiv \forall x \in L, \forall y \in P : y \leq x \Rightarrow y \in L. \quad (11.6)$$

Remark 11.20. We call LP the set of lower sets of P .

Remark 11.21. Note that if A is an antichain of a poset P , then the set

$$I(A) = \{x : x \leq y, y \in A\} \quad (11.7)$$

is a lower set of P .

Consider the blue poset of pizza recipes from before. The upper and lower sets of this poset can be represented as in Fig. 11.13. The upper set can be interpreted as all the potential pizza recipes for which we can find better alternatives in the poset. Similarly, the lower set can be interpreted as all the potential pizza recipes which would be better than the ones in the poset.

Example 11.22 (Upper and lower sets in **Bool**). The booleans $\{\perp, \top\}$ form a poset with $\perp \leq \top : (\text{Bool}, \leq)$. The subset $\{\perp\} \subseteq \text{Bool}$ is not an upper set, since $\perp \leq \top$ and $\top \notin \{\perp\}$.

11. Trade-offs

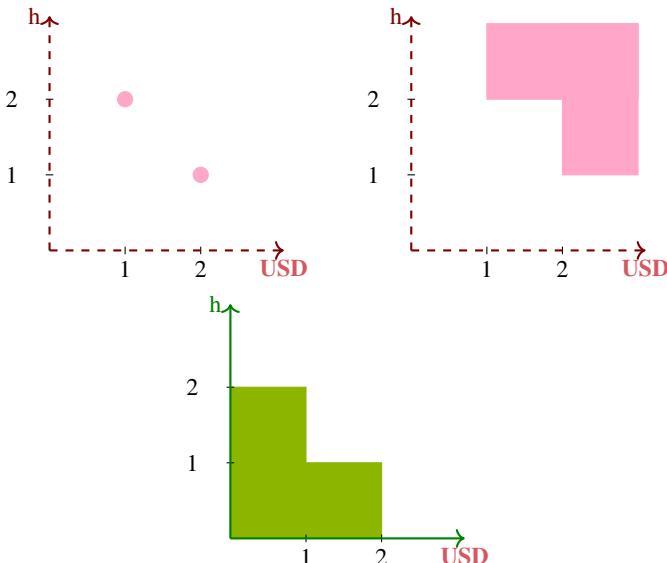


Figure 11.13.: Example of upper and lower sets of a poset of pizza recipes.

11.5. From antichains to uppersets, and viceversa

Definition 11.23 (Upper closure operator). The *upper closure operator* \uparrow maps a subset to the smallest upper set that includes it, i.e.:

$$\begin{aligned} \uparrow: \mathcal{P}(P) &\rightarrow \text{UP} \\ S &\mapsto \{y \in P \mid \exists x \in S : x \leq y\}. \end{aligned} \tag{11.8}$$

Remark 11.24. Note that, by definition, an upper set is closed to upper closure.

Remark 11.25. For any $S \in \mathcal{P}(P)$, $\uparrow S$ is in fact an upper set.

Proof. Suppose $y \in \uparrow S$ and $z \in P$, and suppose $y \leq z$. By definition $\exists x \in S$ s.t. $x \leq y$, meaning that $x \leq z$. Thus, $z \in \uparrow S$, as was to be shown. \square

Lemma 11.26. The upper closure operator \uparrow is a monotone map.

Proof. Consider the posets $\langle \mathcal{P}(P), \subseteq \rangle$ and $\langle \text{UP}, \supseteq \rangle$, and $S_1, S_2 \in \mathcal{P}(P)$. It is clear that given $S_1 \subseteq S_2$, one has

$$\{y \in P \mid \exists x \in S_1 : x \leq y\} \supseteq \{y \in P \mid \exists x \in S_2 : x \leq y\}.$$

Therefore, $\uparrow S_1 \supseteq \uparrow S_2$, satisfying the monotonicity property for \uparrow . \square

Lemma 11.27. Let A and B be subsets of P that are antichains. Then

$$\uparrow A = \uparrow B \Rightarrow A = B.$$

Proof. First, let's fix an $a \in A$. From $\uparrow A = \uparrow B$ we know that in particular $A \subseteq \uparrow B$. This means that for our fixed $a \in A$ there exists $b \in B$ such that $b \leq a$. From $\uparrow A = \uparrow B$ it also follows that $B \subseteq \uparrow A$, so to the $b \in B$ given above, there exists $a' \in A$ such that $a' \leq b$. In total, we have $a' \leq b \leq a$, and since A is an antichain, we must have $a' = a$. This implies that $a' = b = a$. In particular, we have $a \in B$.

The above shows that $A \subseteq B$. To show $B \subseteq A$, we can fix any $b \in B$ and repeat the above argumentation, now with the roles of A and B exchanged. \square

In the example of the pizza recipes, first, consider the upper set of a single element of the poset, e.g. $p_1 = \langle 1 \text{ USD}, 2 \text{ h} \rangle$ (Fig. 11.14). Then, consider the case of two elements, with $p_2 = \langle 2 \text{ USD}, 1 \text{ h} \rangle$

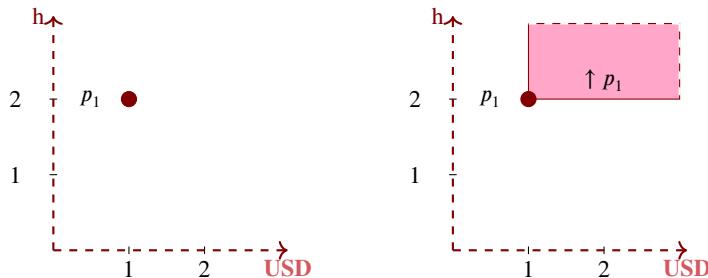


Figure 11.14.: The upper closure of a singleton set of pizza recipes.

(Fig. 11.15).

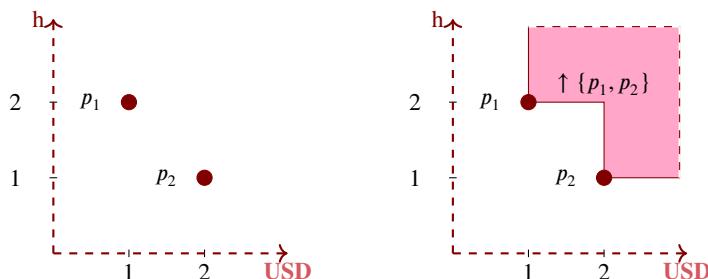


Figure 11.15.: The upper closure of a set of pizza recipes.

Note that the upper set of the subset formed by the two elements is the union of the upper sets of the single elements.

Definition 11.28 (Lower closure operator). The *lower closure operator* \downarrow maps a subset to the smallest lower set that includes it, i.e.

$$\begin{aligned}\downarrow : \mathcal{P}(P) &\rightarrow \mathsf{LP} \\ S &\mapsto \{y \in P \mid \exists x \in S : y \leq x\}.\end{aligned}$$

Lemma 11.29. The lower closure operator \downarrow is a monotone map.

11. Trade-offs

JL: The following proof is a bit redundant... we can say “analogous to the case of the upper closure operation” and/or invoke the principle of duality for posets.

Proof. Consider the posets $\langle \mathcal{P}(P), \subseteq \rangle$ and $\langle \mathcal{LP}, \subseteq \rangle$, and let $S_1, S_2 \in \mathcal{P}(P)$. It is clear that given $S_1 \subseteq S_2$, one has

$$\{y \in P \mid \exists x \in S_1 : y \leq x\} \subseteq \{y \in P \mid \exists x \in S_2 : y \leq x\}. \quad (11.9)$$

Therefore, $\uparrow S_1 \subseteq \uparrow S_2$, satisfying the monotonicity property for \downarrow . \square

Example 11.30. Consider the battery example of Example 11.16, and the antichain given by the battery models $a = \langle 10 \text{ USD}, 1 \text{ kg} \rangle$, $b = \langle 20 \text{ USD}, 0.5 \text{ kg} \rangle$, and $c = \langle 30 \text{ USD}, 0.25 \text{ kg} \rangle$ (Fig. 11.16). The lower closure operator $\downarrow \{a, b, c\}$ represents all the battery models which, if existing, would dominate $\{a, b, c\}$.

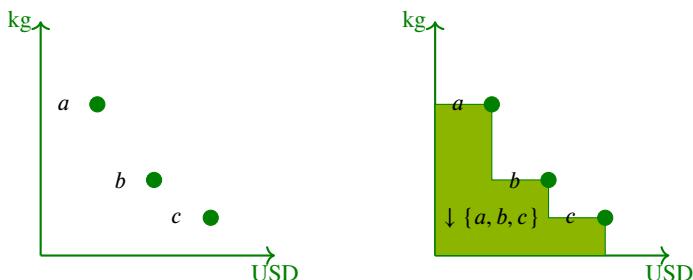


Figure 11.16.: Battery example. From the left: antichain, upper closure, and lower closure.

Definition 11.31 (Min). $\text{Min} : \mathcal{P}(P) \rightarrow \mathcal{AP}$ is the map that sends a subset S of a poset to the minimal elements of that subset, i.e., those elements $a \in S$ such that $a \leq b$ for all $b \in S$. In formulas:

$$\begin{aligned} \text{Min} &: \mathcal{P}(P) \rightarrow \mathcal{AP} \\ S &\mapsto \{x \in S : (y \in S) \wedge (y \leq x) \Rightarrow (x = y)\}. \end{aligned}$$

Note that $\text{Min}(S)$ could be empty.

Definition 11.32 (Max). $\text{Max} : \mathcal{P}(P) \rightarrow \mathcal{AP}$ is the map that sends a subset S of a poset to the maximal elements of that subset, i.e., those elements $a \in S$ such that $a \geq b$ for all $b \in S$. In formulas:

$$\begin{aligned} \text{Max} &: \mathcal{P}(P) \rightarrow \mathcal{AP} \\ S &\mapsto \{x \in S : (y \in S) \wedge (y \geq x) \Rightarrow (x = y)\}. \end{aligned}$$

Note that $\text{Max}(S)$ could be empty.

This is a remnant of older times. To remove.

Lemma 11.33. Given a poset $\langle P, \leq \rangle$, $\langle \mathcal{AP}, \leq_{\mathcal{AP}} \rangle$ is a poset with

$$A \leq_{\mathcal{AP}} B \text{ if and only if } \uparrow A \supseteq \uparrow B. \quad (11.10)$$

Furthermore, it is bounded by the top $\top_{\mathcal{AP}} = \emptyset$ and the bottom $\perp_{\mathcal{AP}} = \{\perp_P\}$.

Proof. We need to show the poset properties (Definition 11.1). We can prove the following:

- *Reflexivity:* From $\langle P, \leq \rangle$ being a poset we know that

$$\begin{aligned} \{y \in P \mid \exists x \in A : x \leq y\} &\supseteq \{y \in P \mid \exists x \in A : x \leq y\}, \\ \uparrow A &= \uparrow A \end{aligned} \tag{11.11}$$

and hence $A \leq_{AP} A$.

- *Antisymmetry:* One has

$$\begin{aligned} (A \leq_{AP} B) \wedge (B \leq_{AP} A) &\Leftrightarrow (\uparrow A \supseteq \uparrow B) \wedge (\uparrow B \supseteq \uparrow A) \\ &\Leftrightarrow \uparrow A = \uparrow B \\ &\Rightarrow A = B. \end{aligned} \tag{11.12}$$

The last implication is by ??.

- *Transitivity:* One has

$$\begin{aligned} (A \leq_{AP} B) \wedge (B \leq_{AP} C) &\Leftrightarrow (\uparrow A \supseteq \uparrow B) \wedge (\uparrow B \supseteq \uparrow C) \\ &\Rightarrow \uparrow A \supseteq \uparrow C \\ &\Rightarrow A \leq_{AP} C. \end{aligned} \tag{11.13}$$

In order to find the top, we need to find the smallest set T_{AP} such that $A \leq_{AP} T_{AP}$ for all $A \in AP$. In other words, such that $\uparrow A \supseteq \uparrow T_{AP}$ for all $A \in AP$. This is clearly \emptyset , since $\uparrow \emptyset = \emptyset$. Similarly, in order to find the bottom, we need to find the set \perp_{AP} such that $\perp_{AP} \leq_{AP} A$ for all $A \in AP$. In other words, such that $\uparrow \perp_{AP} \supseteq \uparrow A$ for all $A \in AP$. We obtain a bottom if we set $\perp_{AP} := T_p$, since $T_p \supseteq A$ for all $A \subseteq P$, and hence, by monotonicity of \uparrow , we have in particular $\uparrow T_p \supseteq \uparrow A$ for all antichains A .

□

Definition 11.34 (Downward closed set). An upper set S is *downward-closed* in a poset P if

$$S = \uparrow \text{Min } S. \tag{11.14}$$

Remark 11.35. The set of downward-closed upper sets of P is denoted \underline{UP} .

11.6. Lattices

Definition 11.36 (Lattice). A *lattice* is a poset $\langle P, \leq \rangle$ with some additional properties:

- Given two points $p, q \in P$, it is always possible to define their least upper bound, called *join*, and indicated as $p \vee q$.
- Given two points $p, q \in P$, it is always possible to define their greatest lower bound, called *meet*, and indicated as $p \wedge q$.

Add the wooden lattice figure here.

These can be defined for preorders as well... move before.

11. Trade-offs

Remark 11.37 (Bounded lattices). If there is a least upper bound for the entire lattice A , it is called the *top* (\top). If a greatest lower bound exists it is called the *bottom* (\perp). If both a top and a bottom exist, we call the lattice *bounded*, and denote it by $\langle A, \leq, \vee, \wedge, \perp, \top \rangle$.

Example 11.38. In Example 11.8 we presented the poset arising from the power set $\mathcal{P}(A)$ of a set A and ordered via subset inclusion. This is a lattice, bounded by A and by the empty set \emptyset . Note that this lattice possesses two (dual) monoidal structures $\langle \mathcal{P}(A), \subseteq, \emptyset, \cup \rangle$ and $\langle \mathcal{P}(A), \subseteq, A, \cap \rangle$.

Example 11.39. Consider the set $\{1, 2, 3, 6\}$ ordered by divisibility. For instance, since 2 divides by 6, we have $2 \leq 6$. This is a lattice. However, the set $\{1, 2, 3\}$ ordered by divisibility is not, since 2 and 3 lack a meet (Fig. 11.17).

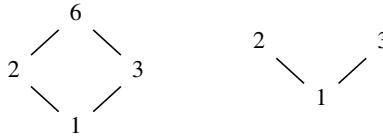


Figure 11.17.: Examples of a lattice and a non-lattice.

Lemma 11.40. UR is a bounded lattice (Definition 11.36) with

$$\langle UR, \leq_{UR}, \perp_{UR}, \top_{UR}, \vee_{UR}, \wedge_{UR} \rangle = \langle UR, \supseteq, R, \emptyset, \cap, \cup \rangle. \quad (11.15)$$

Proof. Consider the poset $\langle UR, \supseteq \rangle$ and $P, Q \in UR$.

- First, we need to show that $P \cap Q \in UR$. One has $P \subseteq UR$ and $Q \subseteq UR$, meaning that by definition, if $x \in P \cap Q$, we have $x \in P \wedge x \in Q$. It follows that $x \in UR$ for all $x \in P \cap Q$. Furthermore, we need to show that $P \cap Q$ is the least upper bound of P, Q . Assume this is not true, i.e. there exists a $T \in UR$, $T \neq P \cap Q$, such that $P \supseteq T \supseteq P \cap Q$ and $Q \supseteq T \supseteq P \cap Q$. Using the fact that intersection preserves inclusions, one has

$$\begin{aligned} P \cap Q &\supseteq T \cap T \supseteq P \cap Q \\ P \cap Q &\supseteq T \supseteq P \cap Q \\ T &= P \cap Q, \end{aligned} \quad (11.16)$$

which contradicts the assumption. Therefore, $P \cap Q$ is the least upper bound of P, Q .

- Second, we need to show that $P \cup Q \in LF$. One has $P \subseteq UR$ and $Q \subseteq UR$, meaning that by definition, if $x \in P \cup Q$, we have either $x \in P$ or $x \in Q$. If $x \in P$, then $x \in UR$. If $x \in Q$, then $x \in UR$. It follows that $x \in UR$ for all $x \in P \cup Q$. Furthermore, we need to show that $P \cup Q$ is the greatest lower bound of P, Q . Assume this is not true, i.e. there exists a $T \in UR$, $T \neq P \cup Q$, such that $P \cup Q \supseteq T \supseteq P$ and $P \cup Q \supseteq T \supseteq Q$. Using the fact that union preserves inclusions, one has

$$\begin{aligned} (P \cup Q) \cup (P \cup Q) &\supseteq T \cup T \supseteq P \cup Q \\ P \cup Q &\supseteq T \supseteq P \cup Q \\ T &= P \cup Q, \end{aligned} \quad (11.17)$$

which contradicts the assumption. Therefore, $P \cup Q$ is the greatest lower bound of P, Q .

We have therefore proved that $\langle UR, \supseteq \rangle$ is a lattice. To show that it is bounded, we notice that $\emptyset \subseteq T$ for any $T \in UR$, meaning that \emptyset is the top. Furthermore, we notice that $T \subseteq R$ for any $T \in UR$, meaning that R is a bottom. Therefore, the lattice is bounded. \square

Lemma 11.41. LF is a bounded lattice (Definition 11.36) with

$$\langle \text{LF}, \leq_{\text{LF}}, \perp_{\text{LF}}, \top_{\text{LF}}, \vee_{\text{LF}}, \wedge_{\text{LF}} \rangle = \langle \text{LF}, \subseteq, \emptyset, F, \cup, \cap \rangle. \quad (11.18)$$

Proof. Consider the poset $\langle \text{LF}, \subseteq \rangle$ and $P, Q \in \text{LF}$.

- First, we need to show that $P \cup Q \in \text{LF}$. One has $P \subseteq \text{LF}$ and $Q \subseteq \text{LF}$, meaning that by definition, if $x \in P \cup Q$, either $x \in P$ or $x \in Q$. If $x \in P$, then $x \in \text{LF}$. If $x \in Q$, then $x \in \text{LF}$. It follows that $x \in \text{LF}$ for all $x \in P \cup Q$. Furthermore, we need to show that $P \cup Q$ is the least upper bound of P, Q . Assume this is not true, i.e. there exists a $T \in \text{LF}$, $T \neq P \cup Q$, such that $P \subseteq T \subseteq P \cup Q$ and $Q \subseteq T \subseteq P \cup Q$. Using the fact that union preserves inclusions, one has

$$\begin{aligned} P \cup Q &\subseteq T \cup T \subseteq P \cup Q \\ P \cup Q &\subseteq T \subseteq P \cup Q \\ T &= P \cup Q, \end{aligned} \quad (11.19)$$

which contradicts the assumption. Therefore, $P \cup Q$ is the least upper bound of P, Q .

- Second, we need to show that $P \cap Q \in \text{LF}$. One has $P \subseteq \text{LF}$ and $Q \subseteq \text{LF}$, meaning that by definition, if $x \in P \cap Q$, we have $x \in P \wedge x \in Q$, i.e. $x \in \text{LF}$, for all $x \in P \cap Q$. Furthermore, we need to show that $P \cap Q$ is the greatest lower bound of P, Q . Assume this is not true, i.e. there exists a $T \in \text{LF}$, $T \neq P \cap Q$, such that $P \cap Q \subseteq T \subseteq P$ and $P \cap Q \subseteq T \subseteq Q$. Using the fact that intersection preserves inclusions, one has

$$\begin{aligned} (P \cap Q) \cap (P \cap Q) &\subseteq T \cap T \subseteq P \cap Q \\ P \cap Q &\subseteq T \subseteq P \cap Q \\ T &= P \cap Q, \end{aligned} \quad (11.20)$$

which contradicts the assumption. Therefore, $P \cap Q$ is the greatest lower bound of P, Q .

We have therefore proved that $\langle \text{LF}, \subseteq \rangle$ is a lattice. To show that it is bounded, we notice that $\emptyset \subseteq T$ for any $T \in \text{LF}$, meaning that \emptyset is the bottom. Furthermore, we notice that $T \subseteq F$ for any $T \in \text{LF}$, meaning that F is a top. Therefore, the lattice is bounded. \square

11. Trade-offs

12. Poset constructions

to write

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12.0.1. Product of posets

We can think of the product of posets.

Definition 12.1 (Product of posets). Given two posets $\langle X, \leq_X \rangle$ and $\langle Y, \leq_Y \rangle$, the *product poset* is $\langle X \times Y, \leq_{X \times Y} \rangle$, where $X \times Y$ is the Cartesian product of two sets (Definition 19.1) and the order $\leq_{X \times Y}$ is given by:

$$\langle x_1, y_1 \rangle \leq_{X \times Y} \langle x_2, y_2 \rangle \Leftrightarrow (x_1 \leq_X x_2) \wedge (y_1 \leq_Y y_2). \quad (12.1)$$

Recalling the pizza recipes example, we have the two posets representing time and money. Given that we want to minimize both time and costs, by considering the money poset containing elements 1 USD, 2 USD, and 3 USD, and the time poset containing elements 1 h, and 2 h, one can represent the product as in Fig. 12.1.

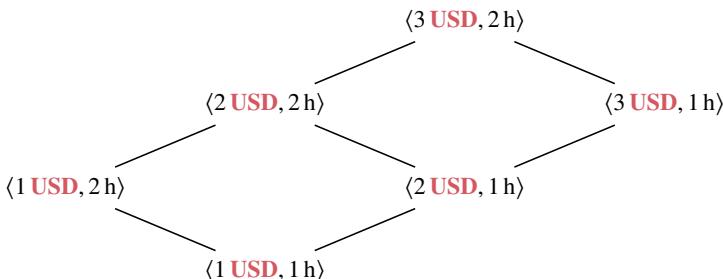


Figure 12.1.: Product poset of time and cost for pizza recipes.

Example 12.2. Consider now the two posets given in Fig. 12.2. Their product is depicted in Fig. 12.3.

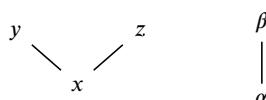


Figure 12.2.: Two posets.

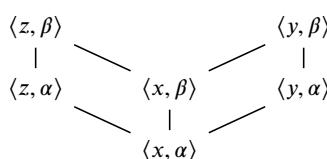


Figure 12.3.: Product of two posets.

12.0.2. Disjoint union of posets

Similarly to what we have done for sets in Section 19.2, we can think of alternatives in the poset case through their disjoint union.

Definition 12.3 (Disjoint union of posets). Given posets $\langle X, \leq_X \rangle$ and $\langle Y, \leq_Y \rangle$, we can define their *disjoint union* $\langle X + Y, \leq_{X+Y} \rangle$, where $X + Y$ is the disjoint union of the sets X and Y (Definition 19.14), and the order \leq_{X+Y} is given by:

$$x \leq_{X+Y} y \equiv \begin{cases} x \leq_A y, & x, y \in X, \\ x \leq_B y, & x, y \in Y. \end{cases} \quad (12.2)$$

$$\begin{aligned} \leq_{X+Y} : (X + Y) \times (X + Y) &\rightarrow \text{Bool} \\ \langle 1, x_1 \rangle, \langle 1, x_2 \rangle &\mapsto (x_1 \leq_X x_2) \\ \langle 2, y \rangle, \langle 1, x \rangle &\mapsto \perp \\ \langle 1, x \rangle, \langle 2, y \rangle &\mapsto \perp \\ \langle 2, y_1 \rangle, \langle 2, y_2 \rangle &\mapsto (y_1 \leq_Y y_2). \end{aligned} \quad (12.3)$$

Example 12.4. Consider the posets $X = \langle \diamond, \star \rangle$ with $\diamond \leq_X \star$, and $Y = \langle \dagger, * \rangle$, with $* \leq_Y \dagger$. Their disjoint union can be represented as in Fig. 12.4.

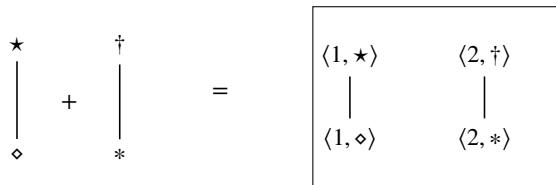


Figure 12.4.: Disjoint union of posets.

12.1. Opposite of a poset

Definition 12.5. The *opposite* of a poset $\langle A, \leq \rangle$ is the poset denoted as $\langle A^{\text{op}}, \leq^{\text{op}} \rangle$ that has the same elements as A and the reverse ordering (Fig. 12.5). For a given $x \in A$, we use x^* to represent its corresponding copy in A^{op} ; note that x and x^* belong to distinct posets. Reversing the order means that, for all $x, y \in A$,

$$x \leq y \Leftrightarrow y^* \leq^{\text{op}} x^*. \quad (12.4)$$

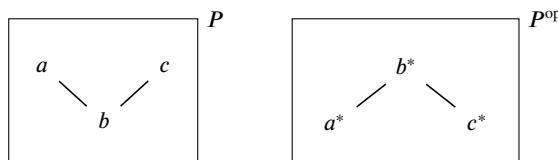


Figure 12.5.: Opposite of a poset.

Example 12.6 (Credit and debt). Let us define the set

$$\text{USD} = \{\$0.00, \$0.01, \$0.02, \dots\}$$

of all US dollars monetary quantities approximated to the cent. From this set we can define two posets: $\text{USD}^+ = \langle \text{USD}, \leq \rangle$ and $\text{USD}^- = \langle \text{USD}, \geq \rangle$, that are the opposite of each other. If the context is that, given two quantities \$1 and \$2, we prefer \$1 to \$2 (for example because it is a cost to pay to acquire a component), then we are working in USD^+ , otherwise we are working in USD^- (for example because it represents the price at which we are selling our product). Traditionally, in double-entry ledger systems, the numbers were not written with negative signs, but rather in color: red and black. From this convention we get the idioms “being in the black” and “being in the red”.

12.2. Poset of intervals

Definition 12.7 (Poset of intervals). An interval is an ordered pair of elements $\langle l, u \rangle$ of P , such that $l \leq_P u$. Given a poset P , one can define a *poset of intervals* on P . Intervals can be ordered by inclusion, e.g.:

$$\langle l_1, u_1 \rangle \leq_{\text{Int } P} \langle l_2, u_2 \rangle \Leftrightarrow (l_1 \leq_P l_2) \wedge (u_2 \leq_P u_1).$$

12.3. A different poset of intervals

to write

13. Life is hard

to write

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13.1. Monotone maps

AC: Add some motivation from design. E.g. generalization of "non-decreasing" and "non-increasing" from real numbers to partial orders

Definition 13.1 (Monotone map). A *monotone map* between two posets $\langle A, \leq_A \rangle$ and $\langle B, \leq_B \rangle$ is a map that preserves the ordering, in the sense that

$$a \leq_A b \Rightarrow f(a) \leq_B f(b).$$

Remark 13.2. Given a poset A , the map id_A is monotone, since for $a_1, a_2 \in A$, one has:

$$\begin{aligned} a_1 \leq_A a_2 &\Rightarrow a_1 = a_1 \circ \text{id}_A \\ &\leq_A a_2 \circ \text{id}_A \\ &= a_2. \end{aligned}$$

Definition 13.3 (Antitone map). An *antitone map* between two posets $\langle A, \leq_A \rangle$ and $\langle B, \leq_B \rangle$ is a map that reverses the ordering, in the sense that

$$a \leq_A b \Rightarrow f(a) \geq_B f(b).$$

Example 13.4 (Unit cost, total cost). Assume that you want to produce some widgets, and that the manufacturing cost depends on the number of widgets. The function describing the total cost $t : \mathbb{N} \rightarrow \mathbb{R}_+$ is a map between the ordered sets \mathbb{N} and \mathbb{R}_+ , and maps each quantity of widgets to a total manufacturing cost (Fig. 13.2). Clearly, t is a monotone function. Conversely, the unit cost function $u : \mathbb{N} \rightarrow \mathbb{R}_+$ is antitone (Fig. 13.1).

Figure 13.1.:

add picture

Figure 13.2.:

add picture

Example 13.5 (Rounding functions).

to write

Example 13.6 (Cardinality map). In Example 11.8 we presented the poset arising from the power set of a set $A = \{a, b, c\}$ and ordered via subset inclusion.

The map $|\cdot| : \mathcal{P}(A) \rightarrow \mathbb{N}$ (cardinality), is a monotone map (Fig. 13.3).

Lemma 13.7. Consider a discrete poset A and a poset B . Any map $f : A \rightarrow B$ is monotone.

Proof. Since A is a discrete poset, one has

$$a_1 \leq_A a_2 \iff a_1 = a_2. \quad (13.1)$$