



**GPU Laboratory**

# The Bridge between Mathematical Models of Physics and Generic Simulations

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Logic, Relativity and Beyond  
2015, Budapest

# Early summary

Motivating Category Theory as a common language to use between Mathematics, Physics and Programming.

# An example from Physics

## Basis changes

- ▶ Covariant quantities (like linear functionals)  
Successive basis transformations, M and N act as:

$$M \cdot N$$

- ▶ Contravariant quantities (vectors)  
Successive basis transformations, M and N act as:

$$N^{-1} \cdot M^{-1}$$

# An example from Programming

Apply an single valued function on a list

Like:

- ▶ multiply a list of numbers by 2
- ▶ Take the square root of each of a list of numbers

# Programming Paradigms

## Imperative Programming:

- ▶ Von Neumann systems: an abstract model of hardware
- ▶ Sequence of commands, r/w memory cells

```
A := [1, 2, 3, 4]
i := 0
while(i ≤ 3)
    Ai := Ai · 2
    i := i + 1
```

# Programming Paradigms

## Imperative Programming:

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## Two problems:

- ▶ Low level, unnecessary details  
→ Functional Programming
- ▶ Error prone  
→ Type Theory

# Programming Paradigms

Functional Programming  
(**solution to the low-levelness**):

- ▶ Definitions of functions in terms of other functions
- ▶ Declarative (what-to-do instead of how-to-do)
- ▶ Functions first class citizens (and higher-order functions)

A = [1, 2, 3, 4]

B = map ( $\cdot 2$ ) A

# Type Theory

Typed programming languages  
(**solution to error proneness**): **Terms and Types**

- ▶ Each term has a type,
- ▶ operations on terms may be restricted to certain types

$A : [\mathbb{Z}]$

$\text{map} : (\mathbb{Z} \rightarrow \mathbb{Z}) \times [\mathbb{Z}] \rightarrow [\mathbb{Z}]$

$A = [1, 2, 3, 4]$

$B = \text{map } (\cdot 2) A$



# Generic Programming

Abstraction over types:

$A : [\mathbb{R}]$

$\text{map} : \forall a . (a \rightarrow a) \times [a] \rightarrow [a]$

$A = [1.6, 2.5, 3.1, \pi]$

$B = \text{map } (\sqrt{\bullet}) A$

more general version:

$\text{map} : \forall a, b . (a \rightarrow b) \times F a \rightarrow F b$

# Another example

Consider equivalence relations:

$$\text{eq} : \mathbb{Z} \times \mathbb{Z} \rightarrow \{\text{True} \vee \text{False}\}$$

or:

$$\text{eq} : a \times a \rightarrow \{\text{True} \vee \text{False}\} \quad \text{for some } a$$

What if, we'd like to modify this to be an equivalence over lists and use something like 'map' to compose a length function to 'eq'?

$$\text{map}_2 : \forall a, b . (b \rightarrow a) \times F a \rightarrow F b$$

# Successive maps

Investigating the properties, we find that:

$$\begin{aligned} \text{map } f \circ \text{map } g &\equiv \text{map } (f \circ g) \\ \text{map}_2 f \circ \text{map}_2 g &\equiv \text{map}_2 (g \circ f) \end{aligned}$$

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We've already seen this earlier:

Successive basis transformations on **linear functionals** act similarly to **map**,  
Successive basis transformations on **vectors** act similarly to **map<sub>2</sub>**!

Is there anything deeper here?

# Category Theory

In a nutshell...

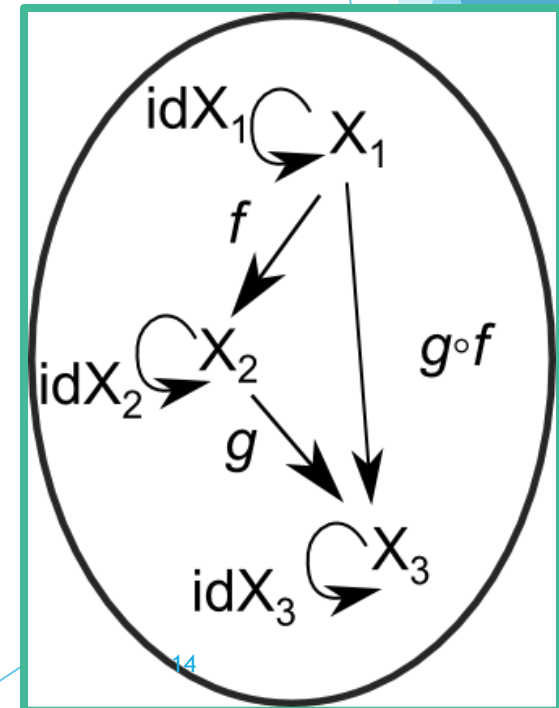
# Category Theory

A category consists of:

- ▶ A collection of **Objects**, denoted by capital letters:  $X$
- ▶ A collection of **Morphisms**, that map between objects:  $X \rightarrow Y$
- ▶ the binary operation of **Morphism Composition**

Required properties:

- ▶ **Associativity** of Morphism composition
- ▶ Existence of **Identity morphisms** for all objects



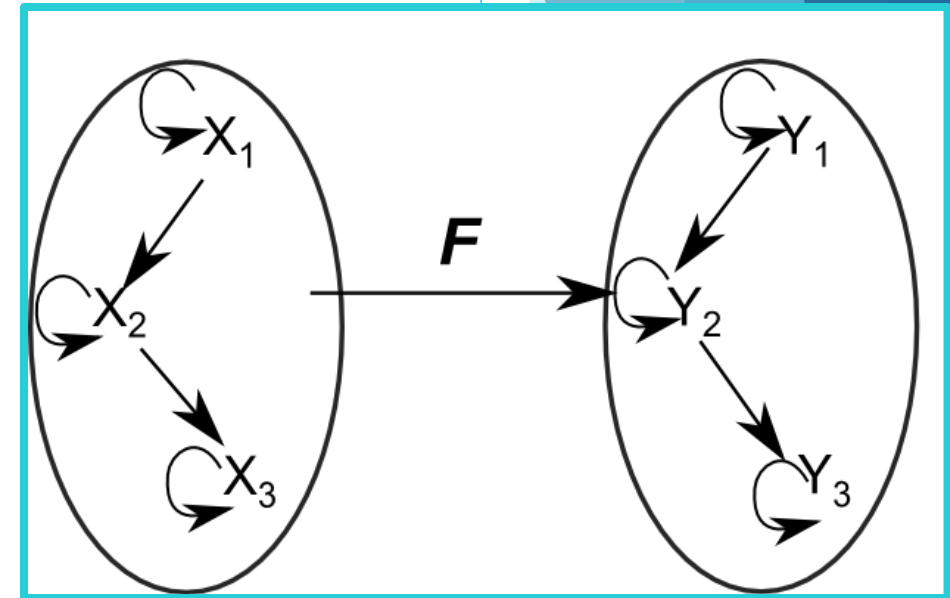
# Category Theory - Functors

## Functor from $\mathcal{C} \rightarrow \mathcal{D}$ :

- ▶  $X \in \mathcal{C} \rightarrow F(X) \in \mathcal{D}$
- ▶  $f: X \rightarrow Y \in \mathcal{C} \rightarrow F(f): F(X) \rightarrow F(Y) \in \mathcal{D}$

Such that:

- ▶  $F(id_X) \rightarrow id_{F(X)} \forall X \in \mathcal{C}$
- ▶  $F(g \circ f) = F(g) \circ F(f) \forall f, g \in \mathcal{C}$



# Category Theory - Functors

## Example: Lists and Natural numbers

- ▶ binary operations:
  - ▶ On lists: list concatenation:  
 $[a, b, c] + [d, e] = [a, b, c, d, e]$
  - ▶ On naturals:  
addition
- ▶ Functor: Length of List



# Category Theory - Functors

Some functors reverse the direction of morphisms:

**Covariant Functors,  $F: C \rightarrow D$ :**

- ▶  $f: X \rightarrow Y \in C \rightarrow F(f): F(\mathbf{X}) \rightarrow F(\mathbf{Y}) \in D$
- ▶  $F(g \circ f) = F(\mathbf{g}) \circ F(\mathbf{f}) \quad \forall f, g \in C$

**Contravariant Functors,  $G: C \rightarrow D$ :**

- ▶  $f: Y \rightarrow X \in C \rightarrow G(f): G(\mathbf{Y}) \rightarrow G(\mathbf{X}) \in D$
- ▶  $G(g \circ f) = G(\mathbf{f}) \circ G(\mathbf{g}) \quad \forall f, g \in C$

# Functors in Physics

See the [online paper](#) for details!

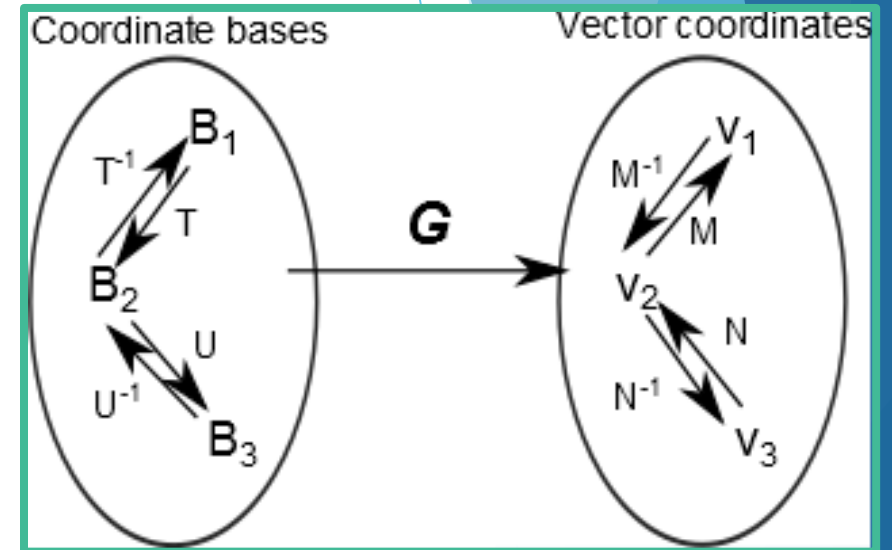
Example from Physics:

Consider the following category **ABS**:

Objects: Bases of a Vector space,

Morphisms: Basis changes

and an other category **REPR** that consists of coordinate representations of **ABS**.



For a fixed vector  $v$ , the **Functor**  $F_v : ABS \rightarrow REPR$  is contravariant, since the basis transformation matrices act in the reverse order.

For a fixed linear functional  $\phi$ , the **Functor**  $G_\phi : ABS \rightarrow REPR$  is covariant, since the basis transformation matrices act in normal order.

# Functors of Physics in Haskell

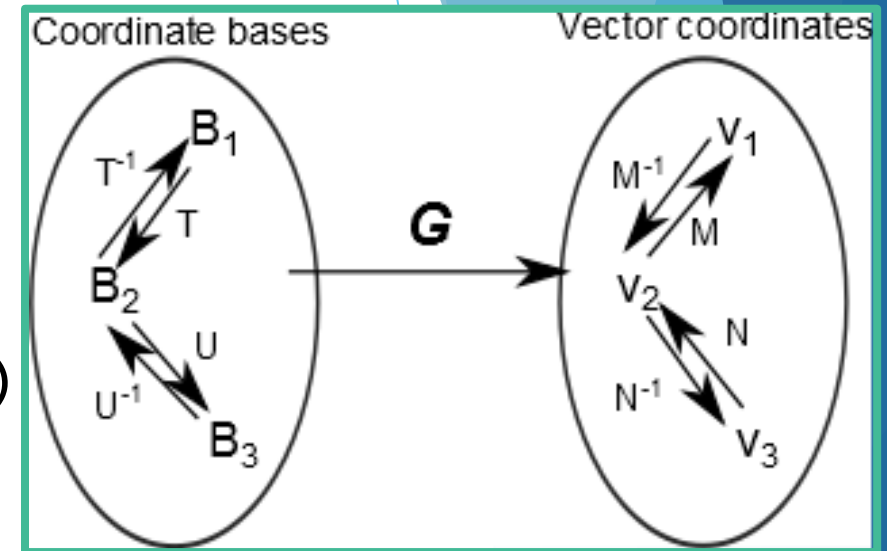
Covariant class - fmap:

```
class Functor G where
```

```
  fmap :: (B1 → B2) → (G B1 → G B2)
```

In words:

fmap can take an abstract basis change and create the coordinate representation of it



# Functors of Physics in Haskell

Covariant class - fmap:

```
class Functor G where
```

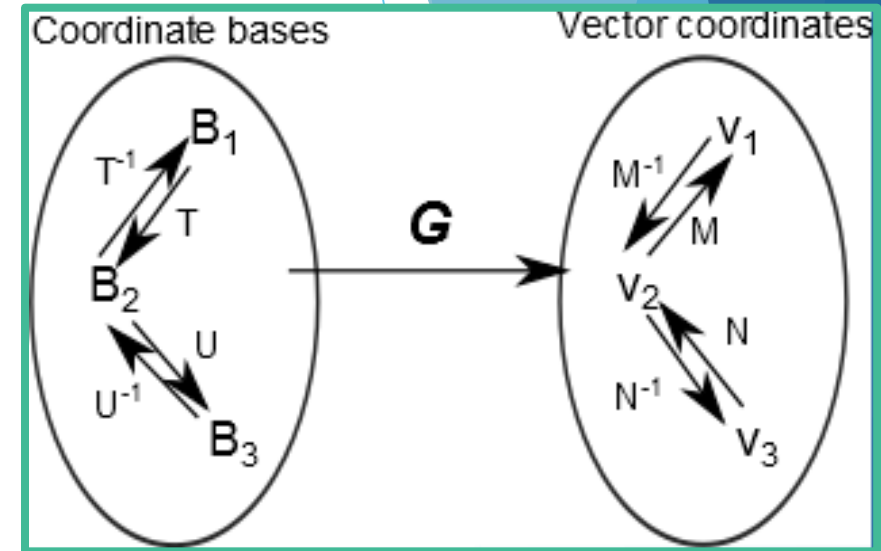
```
  fmap :: (B1 → B2) → (G B1 → G B2)
```

Contravariant class - contramap:

```
class Contravariant F where
```

```
  contramap :: (B2 → B1) → (F B1 → F B2)
```

contramap takes the inverse of the abstract coordinate transform!



# Functors In Generic Programming

Series of abstractions in a generic linear algebra library:

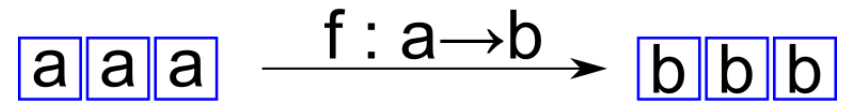
- ▶ Vector of doubles - Scalar Multiplication function
- ▶ Vector of doubles - Generic Unary operation
- ▶ Vector of any type - Generic Unary operation

See the [online paper](#) for an example in C++!

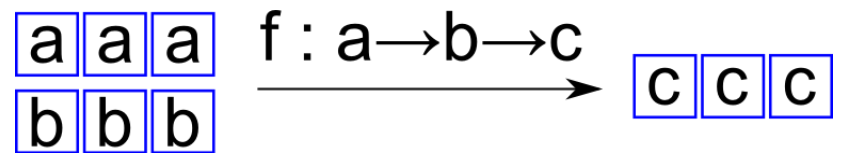
This leads to the implementation of `fmap` and the application of the implicit “concept” of Functor over the Vector of any type

# ZipWith

fmap on containers can be viewed:



Easily generalized to n-ary functions, called zipWith:



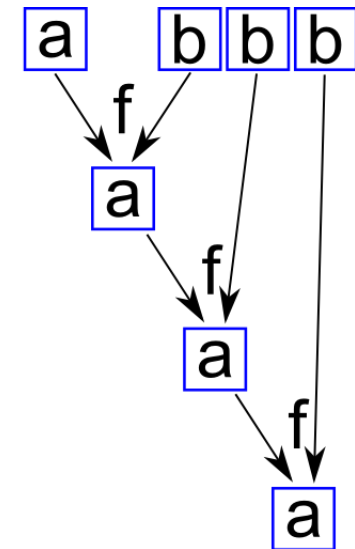
# Fold

Another important concept is the **Foldable**, whose method is `fold` (from the left):

```
foldl (a -> b -> a) -> a -> Foldable b -> a
```

On container like structures it is like:

$f : a \rightarrow b \rightarrow a$



# Example: The case of a linear Algebra library

If `fmap`, `zipwith` and `fold` are available, we can express everything that people usually want from a linear algebra library.

Scalar multiplication:

```
sclmul v x = fmap (*x) v
```

The dot product for example:

```
dot u v = foldl (+) 0 (zipWith (*) u v)
```

The dyadic product for example:

```
dyadic u v = fmap (sclmul v) u
```

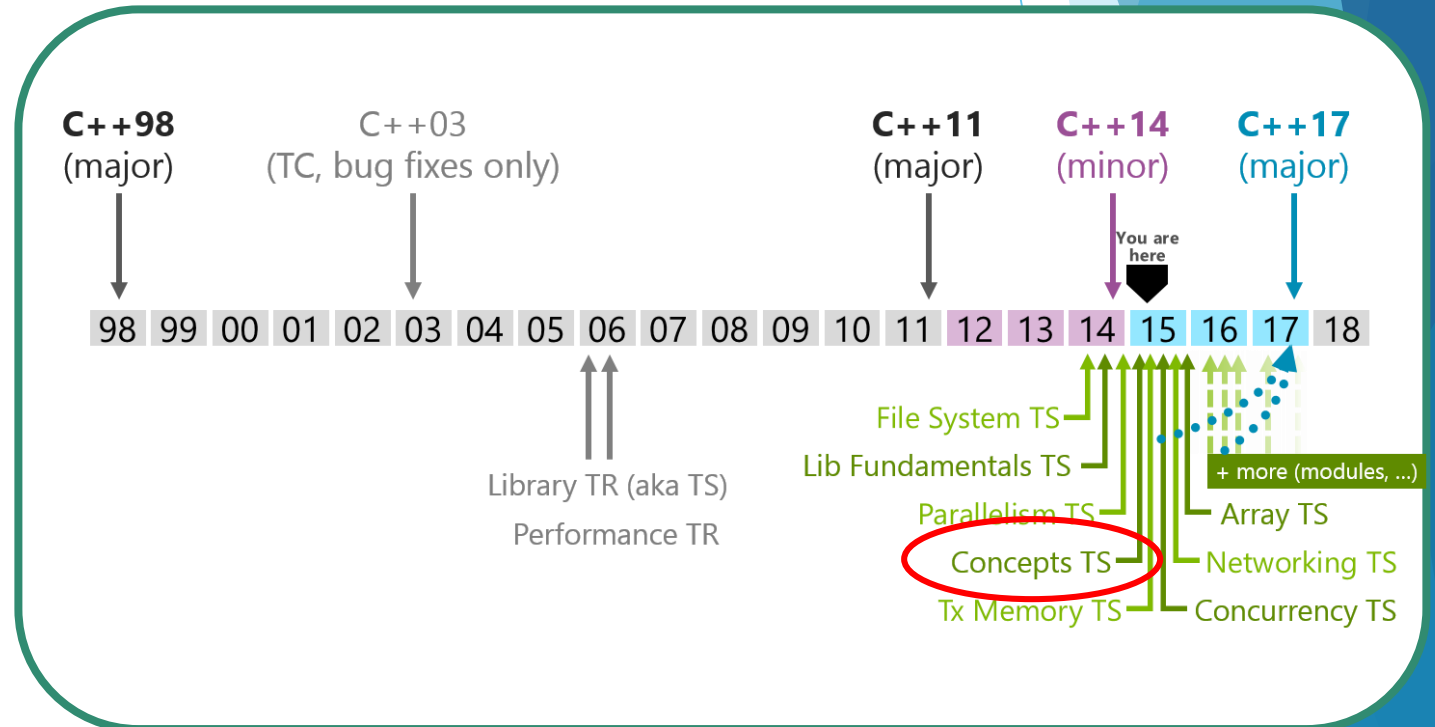


# Outlook

# Future tendencies

Until very recently these programming concepts were just seen as toys of research in academic programming languages

However, recent directions in the evolution of mainstream programming languages (like C++) shows a drastic shift towards functional and generic programming!



# Future tendencies

Today's physics simulations and other HPC solutions have to parallelize calculations in order to utilize hardware.

When combining generic programming with automatic parallelization, abstractions like the presented ones from Category Theory are ubiquitous!



# Future tendencies

If programmers, physicists, mathematicians would agree to speak a common language,

Category Theory,

they could be more effective in their own fields and their collaborative efforts.



# Correspondences

Curry-Howard Correspondence:

Logic	Programming
Proposition	Type
Proof	Program
Disjunction	Sum type (tagged union)
Conjunction	Product type (struct, tuple)
Implication	Function
Invalidity	Uninhabited type (bottom type)

# Correspondences

More correspondences (John C. Baez [arxiv:0903.0340]):  
Category Th., Logic, Topology, Physics, Computation

Category Theory	Physics	Topology	Logic	Programming
Object	Hilbert space	Manifold	Proposition	Type
Morphism	Operator	Cobordism	Proof	Program
Tensor Product	Hilbert space of joint system	Disjoint union of manifolds	Conjunction	Product type (struct, tuple)
Internal Homomorphism	Hilbert space of anti-X and Y	Disjoint union of orientation-reversed X and Y	Implication	Function

# Further outlook

- ▶ Homotopy Type Theory:  
<http://homotopytypetheory.org/>
- ▶ Urs Schreiber - Differential cohomology in a cohesive infinity-topos:  
[arxiv:1310.7930](https://arxiv.org/abs/1310.7930)

Thank you for your attention!





# Type Theory

Origins: The need to avoid paradoxes in formal logic

- ▶ Example: predicate cannot refer to its self

Ingredients: **Terms** and **Types**

Each term has a type, operations may be restricted to certain types

Contrast to Set Theory:

- ▶ Constructive (No Law of Excluded middle)
- ▶ can be run as a program