

Applied Category Theory:

Towards a science of interdisciplinarity

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Outline

1 Introduction

- The fabric of interdisciplinarity
- Our historical moment

2 Operads: a framework for compositional operations

3 Categories: tracking relationships

4 Conclusion

A road to true interdisciplinarity

- Scientific disciplines are conceptual analogies of the world.
 - Science: a schematic, conceptual account of phenomena.
 - Engineering is using these accounts to channel world events.
 - But how do different disciplines and accounts cohere?
 - To solve big problems, we need to connect different approaches.

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- We need a shared fabric, a substrate for interdisciplinarity.
 - Interdisciplinarity consists of effective analogy-making.
 - To go further, we need to formalize the analogies themselves.
- Better yet: we need a conceptual stem-cell.
 - Something that can differentiate into huge variety of forms.
 - Find the analogies between forms as aspects within the stem cell.

Hard science requires math

Consider as you watch:

- Is a hard science of interdisciplinarity & interoperability possible?

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Consider as you watch:

- Is a hard science of interdisciplinarity & interoperability possible?
- What sort of mathematical theory would it require?
- Does Category Theory fit the bill?

Category theory as conceptual stem-cell

Category theory (CT) can differentiate into many forms:

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- All forms of pure math... (we'll briefly discuss this)
- Databases and knowledge representation (categories and functors)
- Functional programming languages (cartesian closed categories)
- Hierarchical planning (lenses and monads)
- Dynamical systems and fractals (operad-algebras, co-algebras)
- Shannon Entropy (operad of simplices)
- Partially-ordered sets and metric spaces (enriched categories)
- Higher order logic (toposes = categories of sheaves)
- Measurements of diversity in populations (magnitude of categories)
- Collaborative design (enriched categories and profunctors)
- Petri nets and chemical reaction networks (monoidal categories)
- Quantum processes and NLP (compact closed categories)

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 - CT—like math—explains, models, formalizes many many things.
 - Conclude that math/CT explains everything and hence nothing?
- Stem cells don't do work until they differentiate.
 - “Adult-level” work requires differentiation and optimization.
 - But the unified origins lead to impressive interoperability.

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- And it's branched out from math in a big way.
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Getting to specifics

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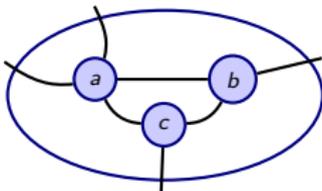
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- Operads: a formalization of “operations”.
- Categories: a formalization of “relationships”.

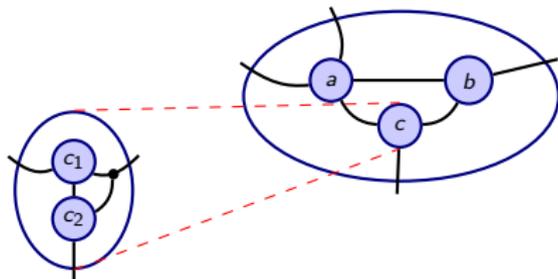
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- 1 Introduction
- 2 Operads: a framework for compositional operations**
 - Compositionality
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 - Examples of operads
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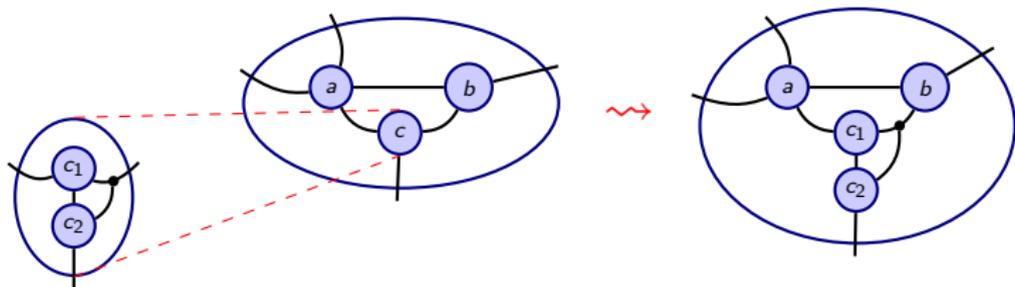
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What are compositional operations?

An operad consists of:

- A collection of **sorts** X, Y, \dots ,
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If you have any questions so far, or want a more formal definition, feel free to ask me now (or later).

Operads are everywhere

Operads are used unconsciously in many fields.

- Electrical engineering: “wiring diagrams”
- Design: “set-based design”
- Computer programming: “data flow”
- Natural language processing: “grammars”
- Materials science: “hierarchical materials”
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- Operads structure this sort of thinking.
- With mathematical structure, we can go much further.

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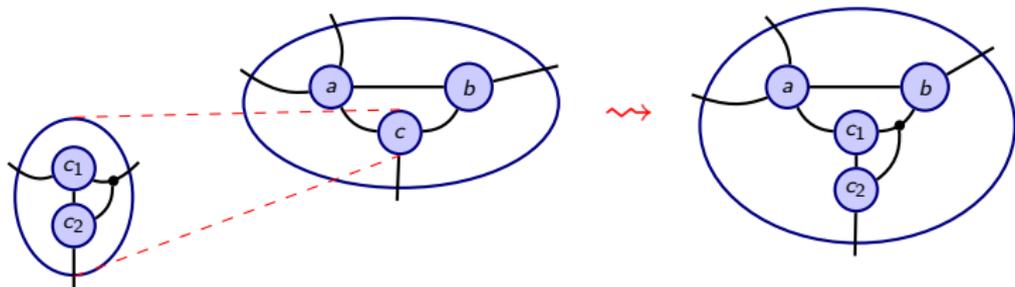
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Let's look for **sorts**, **arrangements**, and **nesting** in some examples.

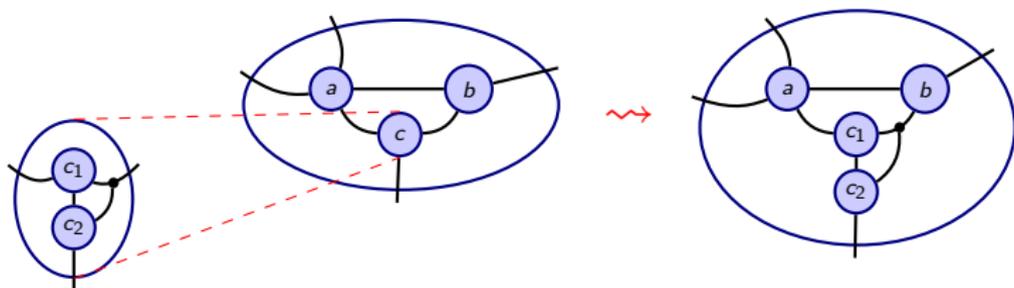
Operad 1: wiring diagrams

Sorts: circles with ports. **Arrangements:** wiring diagrams.



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Applications: tensor networks, databases, contracts.

Operad 2: another kind of wiring diagram

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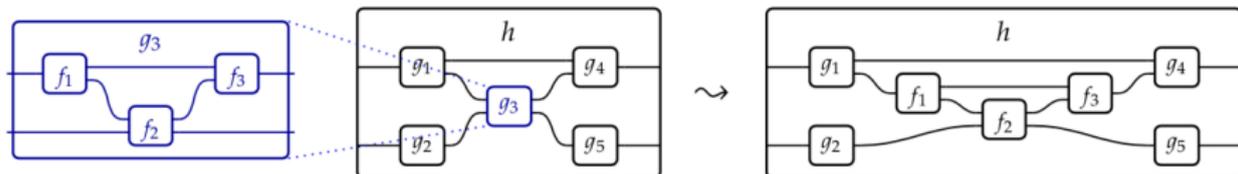
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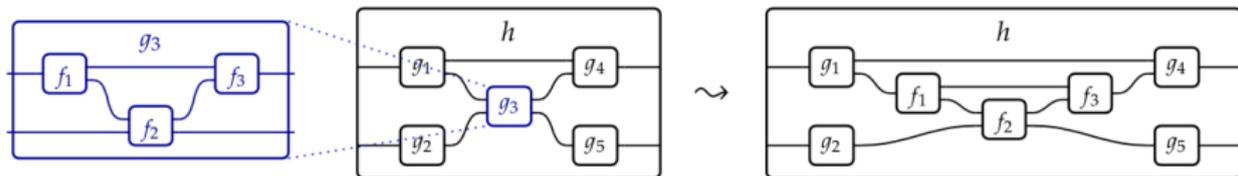


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Applications: dynamical systems, control theory.

Operad 3: hierarchical protein materials

There is an operad \mathcal{M} for composing hierarchical protein materials.

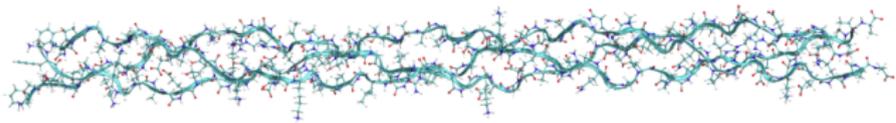
- Why protein materials?
 - Protein materials include your skin: stretchable, breathable, waterproof.
 - Materials scientists would *love* to make materials like this.

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- A **protein** is an **arrangement** of simpler **proteins**.
 - There are “atomic” proteins: amino acids.
 - arrange in series or parallel (H-bonds), or
 - arrange in helices, double helices, any conceivable curve, etc.



- Collagen has a **nested** structure: it is an array, each fiber of which is a triple helix, each strand of which is a helix, each unit of which is an amino acid.¹

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Arrangement: “In this event, there’s a distribution on next events.”

- coin flip: $f = (\frac{1}{2}, \frac{1}{2}) \in \mathcal{P}_2$.
 - In the event coin flip, there’s a 50-50 distribution on next events.
- die roll: $r = (\frac{1}{6}, \dots, \frac{1}{6}) \in \mathcal{P}_6$.
- card selection: $p = (\frac{1}{52}, \dots, \frac{1}{52}) \in \mathcal{P}_{52}$.

The **nesting** rule composes distributions by weighted sum:

- Flip a coin: result decides whether to roll a die or pick a card.

$$f \circ (r, p) = \left(\underbrace{\frac{1}{12}, \dots, \frac{1}{12}}_{6 \text{ times}}, \underbrace{\frac{1}{104}, \dots, \frac{1}{104}}_{52 \text{ times}} \right) \in \mathcal{P}_{58}$$

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And how is this an operad?

- The **sorts** are the parts of speech.
- The **arrangements** are the production rules.
- **Nesting** is given by “syntax trees”.

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- 3 Categories: tracking relationships**
 - Boxes, processes, relationships
 - Examples of categories
 - CQL: Categorical Query Language
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Another theme of category theory

The category-theoretic stem cell also matures to a method for organizing relationships.

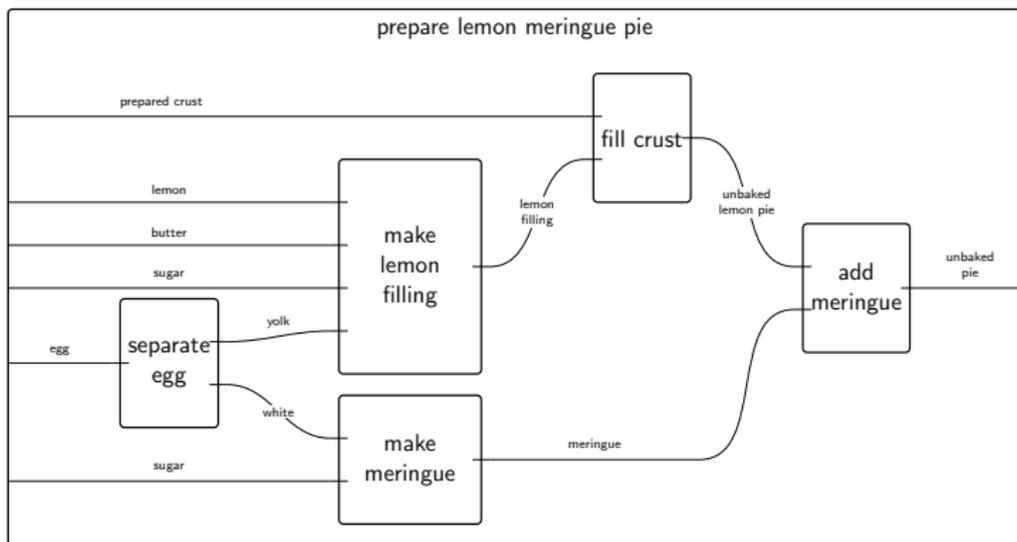
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Let's talk about categories and databases.

- Categories: provide a map of relationships.
- A finite category is a database schema.
- CQL is a category theoretic database query language.

Another look at wiring diagrams



Instead of focusing on the way the boxes are connected, let's focus on what's in the boxes.

What are relationships?

A category consists of:

- A collection of **objects** X, Y, \dots ,
- And **relationships** between them, $\varphi: X \rightarrow Y$,
- Such that relationships can be **composed** $X \xrightarrow{\varphi_1} Y \xrightarrow{\varphi_2} Z$.

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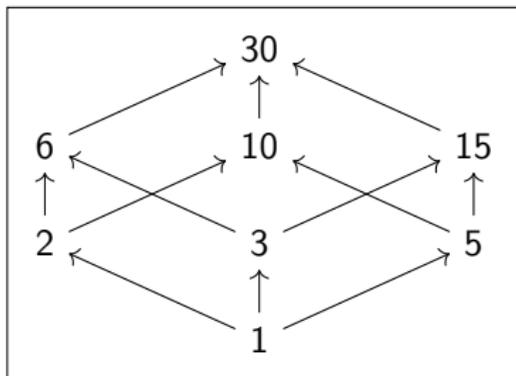
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(Notice the similarity with the definition of operad:

- A collection of **sorts** X, Y, \dots ,
- And ways to **arrange** them, $\varphi: X_1, \dots, X_k \rightarrow Y$,
- Such that arrangements can be **nested** inside each other.)

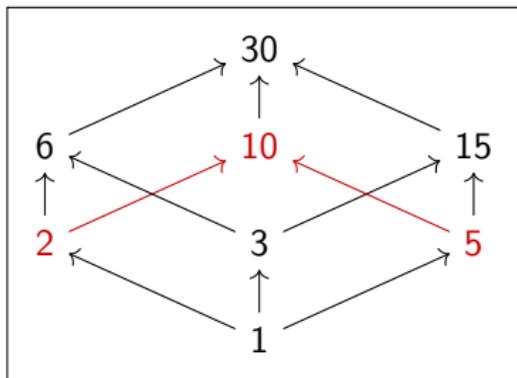
Categories 1: ordering

There is a category where the **objects** are numbers, and **relationships** are divisibility.



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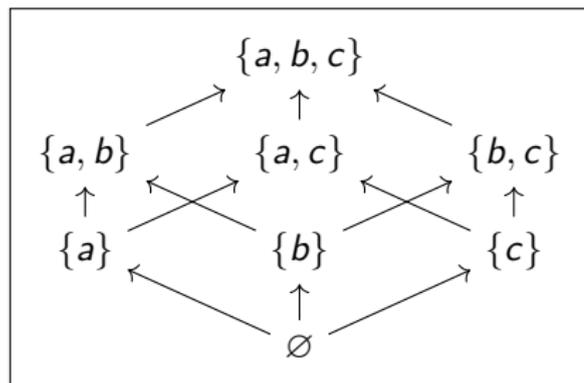
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Concepts such as 'least common multiple' can be expressed using **relationships**.

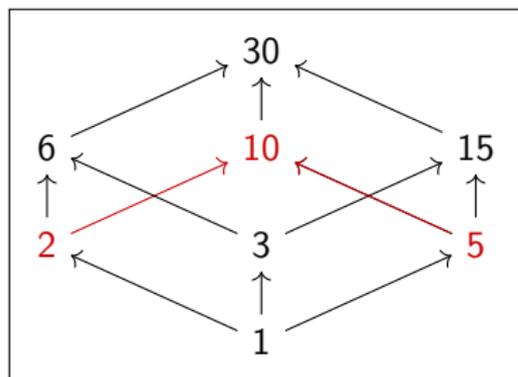
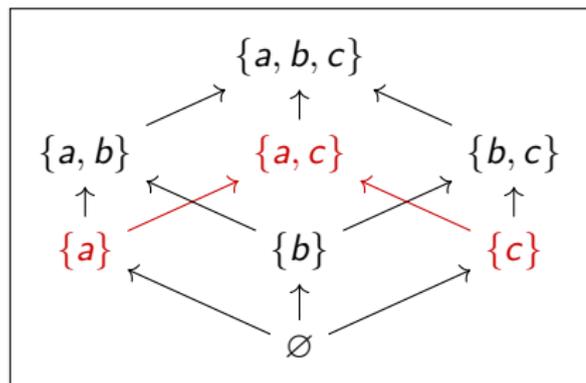
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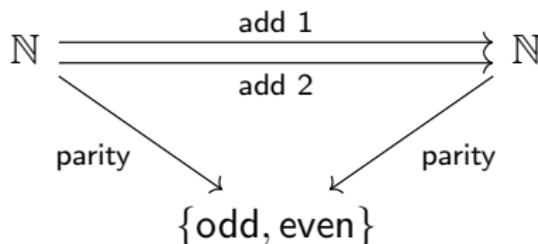


'Union' is analogous to 'least common multiple': they have the same **universal property**.

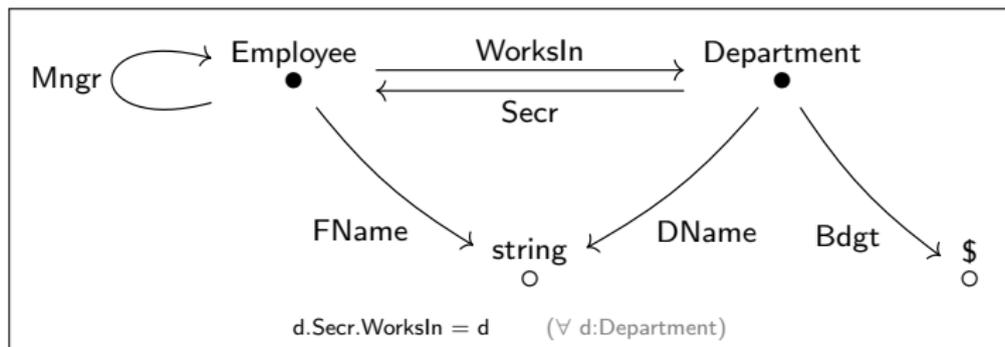
Category 2: sets and functions

The category **Set** of sets and functions is very important

- The **objects** of the category are sets X .
- The **relationships** are functions $f: X \rightarrow Y$.
- The **composition rules** are function composition.



Categories 3: database schemas



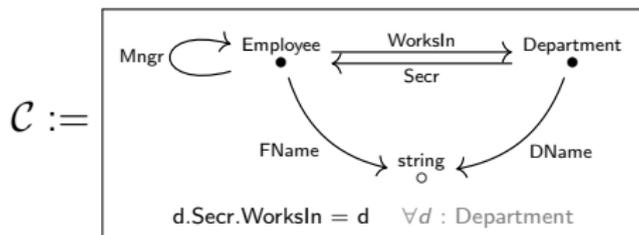
- Database schemas are categories!
 - The **objects** of the category are tables.
 - The **relationships** are columns, connecting one table to another.
 - The **composition rules** are integrity constraints.

Database instances as functors

A functor is a relationship between *categories*.

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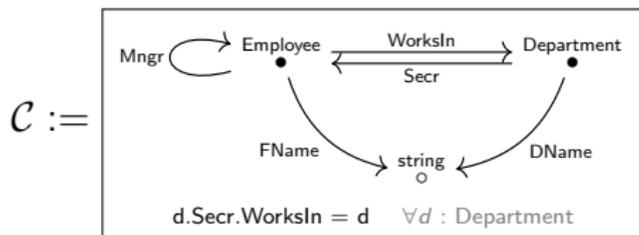


A functor $I: \mathcal{C} \rightarrow \mathbf{Set}$ consists of

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In other words, I fills the schema with compatible data.

$I :=$

Employee	FName	WorksIn	Mngr
1	Alan	101	2
2	Ruth	101	2
3	Kris	102	3

Department	DName	Secr	Bdgt
101	Sales	1	\$10
102	IT	3	\$5

The category of instances

- Given a schema \mathcal{C} , the *category of instances* on \mathcal{C} is denoted $\mathcal{C}\text{-Inst}$.
 - The objects of $\mathcal{C}\text{-Inst}$ are functors (instances) $I: \mathcal{C} \rightarrow \mathbf{Set}$.
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- Functors between schemas allow us to move data between them.
 - Given a functor $F: \mathcal{C} \rightarrow \mathcal{D}$, there are automatically three data transformation functors

$$\mathcal{C}\text{-Inst} \begin{array}{c} \xrightarrow{\Sigma_F} \\ \xleftarrow{\Delta_F} \\ \xrightarrow{\Pi_F} \end{array} \mathcal{D}\text{-Inst}$$

- Δ =project, delete; Σ =sum, union; Π =product, join.
- Δ, Σ, Π were known by mathematicians in 1960 as “Kan extensions”.
- But they had no idea Δ, Σ, Π correspond to database relational algebra (1970).

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 - The arrows are insertions and deduplications of data.
- Functors between schemas allow us to move data between them.
 - Given a functor $F: \mathcal{C} \rightarrow \mathcal{D}$, there are automatically three data transformation functors

$$\mathcal{C}\text{-Inst} \begin{array}{c} \xrightarrow{\Sigma_F} \\ \xleftarrow{\Delta_F} \\ \xrightarrow{\Pi_F} \end{array} \mathcal{D}\text{-Inst}$$

- Δ =project, delete; Σ =sum, union; Π =product, join.
- Δ, Σ, Π were known by mathematicians in 1960 as “Kan extensions”.
- But they had no idea Δ, Σ, Π correspond to database relational algebra (1970).

There's a lot of mathematics ready made for **hygienically** moving data.

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- **And more** (natural transformations, algebraic theories, profunctors, Grothendieck construction, (co-) monads..., simply-typed lambda calculus)

Screenshot

AQL IDE

Run Abort New Open Save < Back Fwd > Options Help Example: AQL

*Untitled 1.aql x

```

1 typeside Ty = empty
2
3 schema S = literal : Ty {
4   entities
5     E
6   foreign_keys
7     f : E -> E
8   path_equations
9     f.f = f
10 }
11 schema T = literal : Ty {
12   entities
13     E2
14   foreign_keys
15     f2 : E2 -> E2
16   path_equations
17     f2.f2.f2 = f2
18 }
19
20 mapping M1 = literal : S -> T {
21   entity E -> E2
22   foreign_keys f -> f2.f2
23 }
24
25 mapping M2 = literal : S -> T {
26   entity E -> E2
27   foreign_keys f -> f2
28 }
29

```

Outline Sort

- typeside Ty
 - ▶ schema S
 - ▶ schema T
 - ▶ mapping M1 : S -> T
 - ▶ mapping M2 : S -> T

Equation $v.f.f = v.f$ translates to $v.f2.f2 = v.f2$, which is not provable

Press 'F2' for focus

Response

Outline

- 1 Introduction
- 2 Operads: a framework for compositional operations
- 3 Categories: tracking relationships
- 4 **Conclusion**
 - Summary

CT for a science of interdisciplinarity

Operads and categories can be used for many things.

- People are already using them in many different fields.
- We can describe them all in a common language.
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Thanks! Questions and comments welcome.