

# ACT 2024 - Proqueries and Praqueries

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# Introduction

- Going to talk about some WIP in categorical database theory.
- This work expands the algebraic model of categorical database theory developed in “Algebraic Databases” [Sch+17] and “Algebraic Data Integration” [SW17].
- (Some of) the main results:
  - Introduce (non-strict) proqueries, data transformations similar to **conjunctive queries**,
  - Prove correctness of proquery presentation composition algorithm (building off of a similar algorithm for uberflower composition in [SW17]),
  - Introduce praqueries, data transformations similar to **unions of conjunctive queries**,
  - Introduce and prove correctness of praquery presentation composition algorithm.

# Categorical Database Theory: the story so far

- 1970 - Relational database theory is born [Cod70]
- Beginning of overlap between DB and CT<sup>1</sup> - [BS81], [LS90], [RW91], [JD94]
- Sketch Data Model (Rosebrugh, Johnson) - [JRW00], [JR02]
- Modern Iteration -
  - Spivak (2012) - Functorial Data Migration [Spi12]
  - Spivak, Wisnesky (2015) - Relational Foundations for Functorial Data Migration [SW15]
  - Schultz, Wisnesky (2017) - Algebraic Data Integration [SW17]
  - Schultz, Vasilakopoulou, Wisnesky, Spivak (2017) - Algebraic Databases [Sch+17]
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<sup>1</sup>References from Rosebrugh's talk [Ros]

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# The Functorial Data Model

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# The Functorial Data Model

Let us quickly recall the **Functorial Data Model** [Spi12].

Database Schema  $\longleftrightarrow$  (small) Category  $\mathcal{C}$

Database Instance  $\longleftrightarrow$  Copresheaf  $\mathcal{I} : \mathcal{C} \rightarrow \mathbf{Set}$

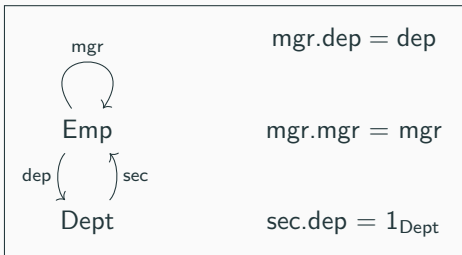
# The Functorial Data Model

Really what we are interested in are **category presentations**.

A cat pres.  $C$  consists of sets

$\text{Sort}(C)$ ,  $\text{Fun}(C)$ , and  $\text{Eq}(C)$ .

**Example:**



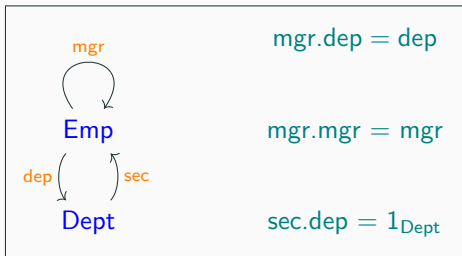
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A cat pres.  $C$  consists of sets

$\text{Sort}(C)$ ,  $\text{Fun}(C)$ , and  $\text{Eq}(C)$ .

**Example:**



**Note:** Equations are between paths, written  $p =_C q$  and composition is written left to right.



# The Functorial Data Model

Given a category presentation  $C$ , we let  $\langle C \rangle$  denote the category it presents. We also call  $\langle C \rangle$  the **semantics** of  $C$ . Its objects are the sorts of  $C$  and its morphisms are the paths in  $C$ , modulo equations.

More formally  $\langle C \rangle(c, c')$  is the set of paths from  $c$  to  $c'$  modulo the **provable equality relation**  $\approx_C$ , defined as follows:

$$\frac{p =_C q}{p \approx_C q}$$

$$\frac{}{p \approx_C p}$$

$$\frac{p \approx_C q}{q \approx_C p}$$

$$\frac{p \approx_C q \quad q \approx_C r}{p \approx_C r}$$

$$\frac{f : c \rightarrow c' \quad p \approx_C q : c' \rightarrow c''}{f.p \approx_C f.q}$$

$$\frac{f : c' \rightarrow c'' \quad p \approx_C q : c \rightarrow c'}{p.f \approx_C q.f}$$

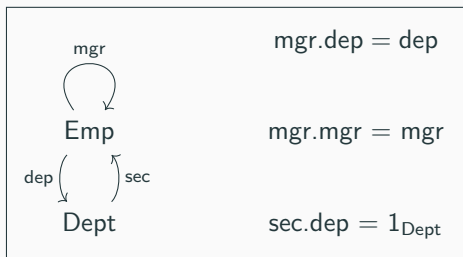
# The Functorial Data Model

We have the following sets of morphisms

$$\langle C \rangle(\text{Emp}, \text{Dept}) = \{[\text{dep}] = [\text{dep.sec.dep}] = [\text{mgr.dep}] = [\text{mgr.mgr.dep}]\},$$

$$\langle C \rangle(\text{Dept}, \text{Emp}) = \{[\text{sec}] = [\text{sec.dep.sec}], [\text{sec.mgr}]\}$$

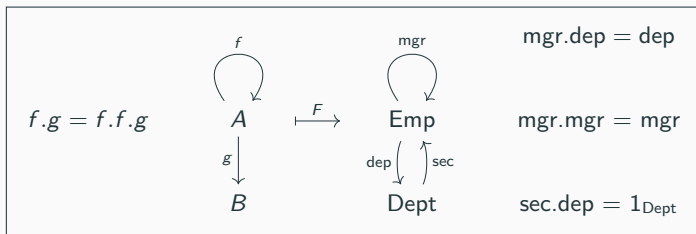
**Example:**



# The Functorial Data Model

Can define schema/category presentation morphisms  $F : C \rightarrow D$  by functions  $F_0 : \text{Sort}(C) \rightarrow \text{Sort}(D)$  and  $F_1 : \text{Fun}(C) \rightarrow \text{Path}(D)$ . Let  $F$  denote the extension of  $F_1$  to paths.

We require that if  $p =_C q$ , then  $F(p) \approx_C F(q)$ .



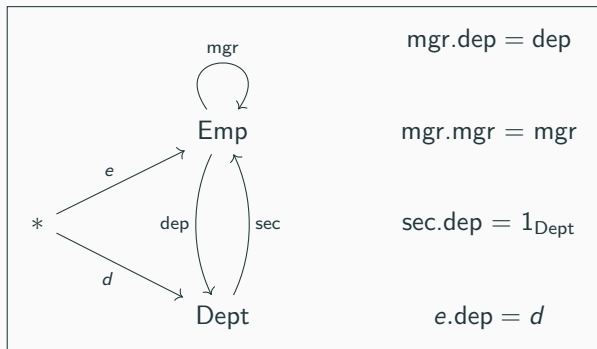
$F(f.g) \neq F(f.f.g)$ , but  $F(f.g) \approx_C F(f.f.g)$   
 $\text{mgr}.\text{dep} \neq \text{mgr}.\text{mgr}.\text{dep}$ , but  $\text{mgr}.\text{dep} \approx_C \text{mgr}.\text{mgr}.\text{dep}$

# The Functorial Data Model

Get a category **CatPr** with semantics functor

$$(|-|) : \mathbf{CatPr} \rightarrow \mathbf{Cat}$$

Can also define **instance presentations**.

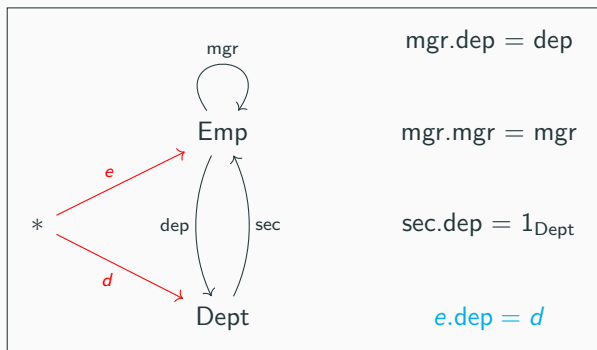


# The Functorial Data Model

An instance presentation  $I$  consists of a collection of **generators** and **equations**. We write  $I = \langle I_G \mid I_E \rangle$ .

**Example:**

$$I = \langle e : \text{Emp}, d : \text{Dept} \mid e.\text{dep} = d \rangle$$



# The Functorial Data Model

Given an instance presentation

$$I = \langle e : \text{Emp}, d : \text{Dept} \mid e.\text{dep} = d \rangle$$

we can display it using tables:

Emp	mgr	dep
e	e.mgr	d
e.mgr	e.mgr	d
d.sec	d.sec.mgr	d
d.sec.mgr	d.sec.mgr	d

Dept	sec
d	d.sec

These are analogous to relational tables of **incomplete information** [Are+14, Section 2.3], also called **labelled nulls**.

# The Functorial Data Model

Given an instance presentation  $I$  on a schema presentation  $C$ , we obtain semantics  $\llbracket I \rrbracket : \langle C \rangle \rightarrow \mathbf{Set}$  by setting

$$\llbracket I \rrbracket(c) = \{ * \rightarrow c \} / \approx_{\text{Eq}(C) \cup E}$$

Morphisms of instance presentations  $\varphi : I \rightarrow J$  over a schema presentation  $C$  require  $*$  to be sent to  $*$  and are the identity on  $C$ .

Get category  $C\mathbf{InstPr}$  and semantics functor

$$\llbracket - \rrbracket : C\mathbf{InstPr} \rightarrow \mathbf{Set}^{\langle C \rangle}$$

# The Functorial Data Model

Note however, that there is no actual “data” in our tables. We merely keep track of **primary keys** and **foreign keys**.

Emp	mgr	dep
e	e.mgr	d
e.mgr	e.mgr	d
d.sec	d.sec.mgr	d
d.sec.mgr	d.sec.mgr	d

Dept	sec
d	d.sec

To add in “data”, we use the **Algebraic Model** [Sch+17], [SW17].



# The Algebraic Data Model

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# The Algebraic Data Model

An **algebraic signature**  $\Sigma$  consists of sets:

$$\text{Sort}(\Sigma), \quad \text{and} \quad \text{Fun}(\Sigma),$$

But now, function symbols are allowed to have higher **arity**.

We say  $f : (s_1, \dots, s_n) \rightarrow s$  has arity  $n$ .

We call 0-ary function symbols **constant symbols**.

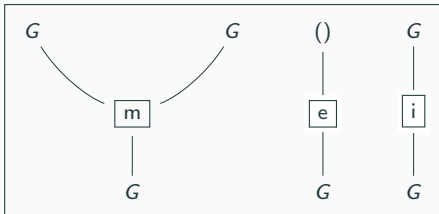
**Example:** Algebraic signature for groups  $\Sigma_{\text{Grp}}$

$$\text{Sort}(\Sigma_{\text{Grp}}) = \{G\},$$

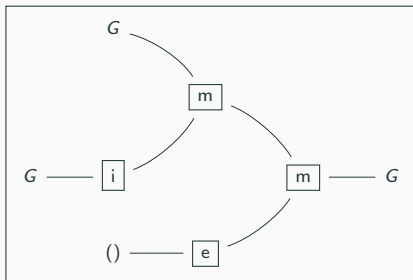
$$\text{Fun}(\Sigma_{\text{Grp}}) = \{m : (G, G) \rightarrow G, e : () \rightarrow G, i : G \rightarrow G\}$$

# The Algebraic Data Model

We can visualize function symbols as follows

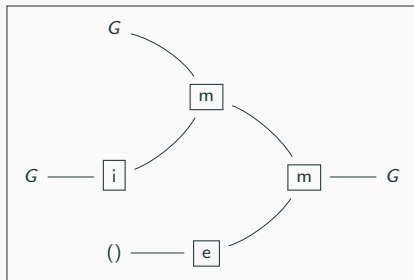


We can build **terms** by putting these function symbols together



# The Algebraic Data Model

We use a convenient notation for these terms. For example:



Can be written as

$$x, y : G \vdash m(m(x, i(y)), e) : G$$

# The Algebraic Data Model

Use the terminology:

$$\overbrace{x, y : G \vdash m(m(x, i(y)), e) : G}^{\text{Term}}$$

Context Sort

An **algebraic presentation**  $T$  consists of an algebraic signature  $(\text{Sort}(T), \text{Fun}(T))$  and a set  $\text{Eq}(T)$  of **equations** between terms

**Example:** Algebraic presentation of groups  $T_{\text{Grp}}$

$$\text{Sort}(T_{\text{Grp}}) = \{G\},$$

$$\text{Fun}(T_{\text{Grp}}) = \{m : (G, G) \rightarrow G, e : () \rightarrow G, i : G \rightarrow G\}$$

$$\begin{aligned} \text{Eq}(T_{\text{Grp}}) = & \{[x, y, z : G \vdash m(m(x, y), z) = m(x, m(y, z))] : G\}, \\ & [x : G \vdash m(x, e) = x], [x : G \vdash m(e, x) = x] \\ & [x : G \vdash m(x, i(x)) = e], [x : G \vdash m(i(x), x) = e] \} \end{aligned}$$

# The Algebraic Data Model

If  $T$  is an algebraic presentation, we can define an equivalence relation  $\approx_T$  on terms, similar to category presentations.

Let  $\llbracket T \rrbracket$  denote the category whose objects are contexts, and morphisms are terms modulo  $\approx_T$ .

The function symbols produce morphisms

$$G \times G \xrightarrow{m} G, \quad * \xrightarrow{e} G, \quad G \xrightarrow{i} G$$

Morphisms of algebraic presentations  $F : T \rightarrow T'$

Sorts  $s \mapsto$  Sorts  $F(s)$

Function Symbols  $f \mapsto$  Terms  $F(f)$

Equations  $t =_T t' \mapsto$  Provable Equations  $F(t) \approx_{T'} F(t')$

Semantics gives a functor  $\llbracket - \rrbracket : \mathbf{AlgPr} \rightarrow \mathbf{FPCat}$ .

# The Algebraic Data Model

Let us fix an algebraic presentation  $Ty$ , that we call the **typeside**.

**Example:**

$$\text{Sort}(Ty) = \{\text{Str}, \text{Int}\},$$

$$\text{Fun}(Ty) = \{+ : (\text{Int}, \text{Int}) \rightarrow \text{Int}, \text{succ} : \text{Int} \rightarrow \text{Int}, 0 : () \rightarrow \text{Int},$$

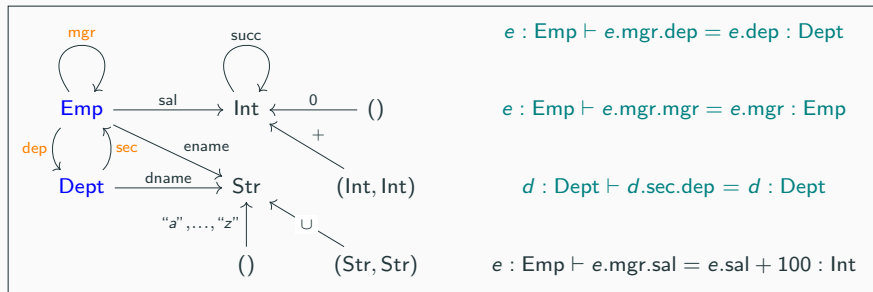
$$\cup : (\text{Str}, \text{Str}) \rightarrow \text{Str}, "a", \dots, "z" : () \rightarrow \text{Str}\}$$

Now let us define an **algebraic schema presentation**.

# The Algebraic Data Model

An algebraic schema presentation  $U$  over a fixed typeside  $Ty$ , consists of

- Entityside: **Entities**, **Foreign Keys**, **Entity Equations**,
- Typeside,
- Attributes, Schema Equations

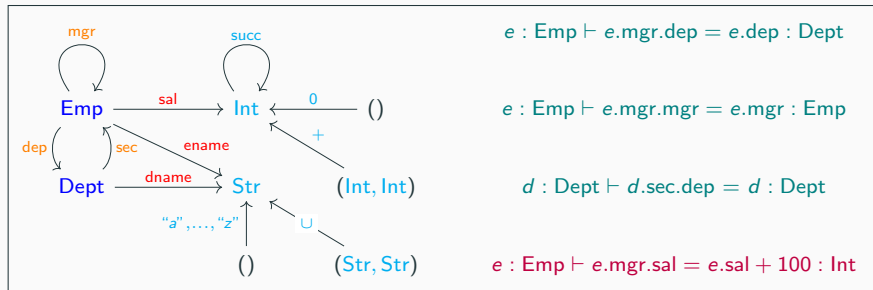




# The Algebraic Data Model

An algebraic schema presentation  $U$  over a fixed typeside  $Ty$ , consists of

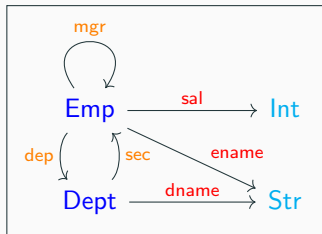
- Entityside: **Entities**, **Foreign Keys**, **Entity Equations**,
- **Typeside**,
- **Attributes**, **Schema Equations**



**Note:** We typically do not denote the typeside operations. They are understood from the definition of  $Ty$ .

# The Algebraic Data Model

So an algebraic schema presentation looks like the following:



We want semantics to reflect this structure.

# The Algebraic Data Model

**Def:** Given categories  $\mathcal{C}, \mathcal{D}$ , a bipartite category<sup>3</sup>  $\mathcal{E} : \mathcal{C} \rightarrow \mathcal{D}$  consists of a category  $\mathcal{E}$  equipped with a functor  $\pi : \mathcal{E} \rightarrow \mathbf{2}$  such that  $\pi^{-1}(0) = \mathcal{C}$  and  $\pi^{-1}(1) = \mathcal{D}$ .

Thus if  $U$  is a schema presentation, then we obtain a bipartite category

$$\langle U \rangle : \overbrace{\langle U_e \rangle}^{\text{Entity category}} \rightarrow \overbrace{\llbracket \text{Ty} \rrbracket}^{\text{Typeside}}$$

This inspires the following definition.

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<sup>3</sup>Equivalently a profunctor

# The Algebraic Data Model

**Def:** Given a fixed finite product category  $\mathcal{T}$ , a **schema** consists of a bipartite category

$$\mathcal{U} : \mathcal{U}_e \rightarrow \mathcal{T},$$

such that the inclusion  $\mathcal{T} \hookrightarrow \mathcal{U}$  preserves finite products<sup>4</sup>.

An **instance** on  $\mathcal{U}$  is a functor  $\mathcal{I} : \mathcal{U} \rightarrow \mathbf{Set}$  that preserves the finite products of  $\mathcal{T}$ .

We can define schema presentations and instance presentations as before. This allows us to input schemas and presentations into a computer.

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<sup>4</sup>Also called an algebraic profunctor in [Sch+17]

# The Algebraic Data Model

In the algebraic model, instances can now display data other than labelled nulls, while still having incomplete information.

**Example:**

$$I_{\Gamma} = \left( \begin{array}{l} \Gamma = (e_0, e_1, e_2 : \text{Emp}, d_0, d_1 : \text{Dept}) \\ \left. \begin{array}{l} e_0.\text{ename} = \text{"Alice"}, e_1.\text{ename} = \text{"Bob"}, e_2.\text{ename} = \text{"Charlie"}, \\ d_0.\text{dname} = \text{"CS"}, \quad d_1.\text{dname} = \text{"Math"}, \\ e_0.\text{mgr} = e_0, \quad e_1.\text{mgr} = e_2, \quad e_2.\text{mgr} = e_2, \\ \dots \end{array} \right\} \end{array} \right)$$

Emp	mgr	dep	sal	ename
$e_0$	$e_0$	$d_0$	100	"Alice"
$e_1$	$e_2$	$d_1$	$e_1.\text{sal}$	"Bob"
$e_2$	$e_2$	$d_1$	$e_2.\text{sal}$	"Charlie"

Dept	sec	dname
$d_0$	$e_0$	"CS"
$d_1$	$e_2$	"Math"

# The Algebraic Data Model

Now in order to really call ourselves database theorists, we need to be able to **query** our data.

**Idea of Proqueries:** Profunctors between algebraic schemas.

**Def:** Given a schema  $\mathcal{U}$  and  $u \in \mathcal{U}$ , let  $y(u)$  denote the  $\mathcal{U}$ -instance given by

$$y(u)(u') = \mathcal{U}(u, u').$$

Call this the **representable instance** on  $u$ .

Can be presented very easily:

$$y(u) = \llbracket \langle \overbrace{x : u}^{1 \text{ generator}} \mid \overbrace{\emptyset}^{\text{no equations}} \rangle \rrbracket$$

# The Algebraic Data Model

**Def:** Given schemas  $\mathcal{U}$  and  $\mathcal{V}$ , a (strict) **proquery** is a functor  $\mathcal{P} : \mathcal{U}^{\text{op}} \rightarrow \mathcal{V}\mathbf{Inst}$ , such that  $\mathcal{P}(t) = y(t)$ , for every  $t \in \text{Ty}$ , where  $y(t)$  is the representable instance on  $t$ .

In general, we allow proqueries to have  $\mathcal{P}(t) \cong y(t)$ . However, every proquery is isomorphic to a strict proquery.

Think of analogue of profunctor as  $\mathcal{P} : \mathcal{C}^{\text{op}} \rightarrow \mathbf{Set}^{\mathcal{D}}$  with an extra twist due to attributes.

# The Algebraic Data Model

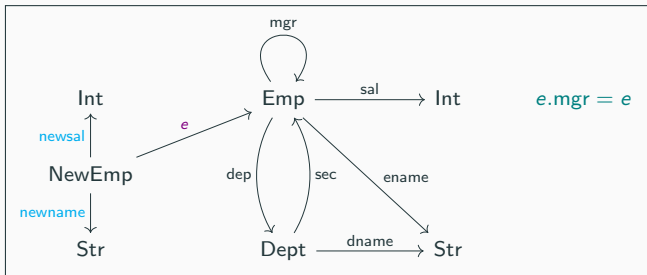
Easier to understand using presentations.

Proquery  $P$  : “Select the name and (salary + 50) of all employees who are their own manager”

**SELECT** e.ename **AS** newname, e.sal + 50 **AS** newsal,

**FROM** e : Emp,

**WHERE** e.mgr = e;





# The Algebraic Data Model

```
SELECT e.ename AS newname, e.sal + 50 AS newsal,  
FROM e : Emp,  
WHERE e.mgr = e;
```

This gives a diagram of  $U$ -instance presentations.

$$y(\text{Int}) \xrightarrow{\text{newsal}} P(\text{NewEmp}) \xleftarrow{\text{newname}} y(\text{Str})$$

$$\langle n : \text{Int} \mid \emptyset \rangle \xrightarrow{\text{newsal}} \langle e : \text{Emp} \mid e.\text{mgr} = e \rangle \xleftarrow{\text{newname}} \langle s : \text{Str} \mid \emptyset \rangle$$

$$\text{newsal} = (n \mapsto [e : \text{Emp} \vdash e.\text{sal} + 50 : \text{Int}])$$

$$\text{newname} = (s \mapsto [e : \text{Emp} \vdash e.\text{ename} : \text{Str}])$$

# The Algebraic Data Model

Given a proquery  $\mathcal{P} : \mathcal{U} \rightarrow \mathcal{V}$ , get a functor

$$\Gamma_{\mathcal{P}} : \mathcal{V}\mathbf{Inst} \rightarrow \mathcal{U}\mathbf{Inst}$$

This is called the **evaluation** functor. Defined for  $\mathcal{I} \in \mathcal{V}\mathbf{Inst}$  and  $u \in \tilde{\mathcal{U}}$  by

$$\Gamma_{\mathcal{P}}(\mathcal{I})(u) = \mathcal{V}\mathbf{Inst}(\mathcal{P}(u), \mathcal{I})$$

It has a left adjoint  $\Lambda$ , called **co-evaluation**.

**Thm**[Sch+17, Thm 8.10] If  $F : \mathcal{V}\mathbf{Inst} \rightarrow \mathcal{U}\mathbf{Inst}$  is a functor such that  $F(\mathcal{I})(t) \cong \mathcal{I}(t)$  and is a right adjoint, then there exists a proquery  $\mathcal{P}$  such that  $F \cong \Gamma_{\mathcal{P}}$ .

# The Algebraic Data Model

Proquery  $P : U \rightarrow V$

**SELECT** e.ename **AS** newname, e.sal + 50 **AS** newsal,

**FROM** e : Emp,

**WHERE** e.mgr = e;

V-Instance  $I$

Emp	mgr	dep	sal	ename
$e_0$	$e_0$	$d_0$	100	"Alice"
$e_1$	$e_2$	$d_1$	$e_1$ .sal	"Bob"
$e_2$	$e_2$	$d_1$	$e_2$ .sal	"Charlie"

Dept	sec	dname
$d_0$	$e_0$	"CS"
$d_1$	$e_2$	"Math"

U-Instance  $\Gamma_P(I)$

NewEmp	newname	newsal
$e_0$	"Alice"	150
$e_2$	"Charlie"	$e_2$ .sal + 50

## New Work

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Given proqueries  $\mathcal{P} : \mathcal{U} \rightarrow \mathcal{V}$  and  $\mathcal{Q} : \mathcal{V} \rightarrow \mathcal{W}$ , we can compose them by setting

$$(\mathcal{P} \odot \mathcal{Q})(u) = \int^{v \in \mathcal{V}} \mathcal{P}(u, v) \cdot \mathcal{Q}(v)$$

taken in the category  $\mathcal{W}\text{Inst}$ . Analogous to **subquery unnesting** or **view unfolding** in database theory.

However, in [Sch+17] and [SW17], two **inequivalent** notions of proquery presentation are given.

- Called **bimodule presentations** in [Sch+17], and
- Called **uberflowers** in [SW17].

A composition operation for uberflowers is sketched, but never proven to be semantically correct.

A composition operation for bimodule presentations is not given.

It turns out that a “semantically correct” and finite-preserving composition operation cannot be given for bimodule presentations!

This motivated us to write “Presenting Profunctors” [RMM24].

**New Contribution:** Give fully specified definition of proquery presentation and prove their correctness, i.e. define a composition operation  $P \circledast Q$  such that  $(P \circledast Q) \cong (P) \circ (Q)$ , and this preserves **finiteness** of the presentations.

**New Contribution:** We introduce **praqueries**. These are similar to proqueries using the following analogy:

proqueries  $\sim$  conjunctive queries

praqueries  $\sim$  unions of conjunctive queries

**Def:** Given schemas  $\mathcal{U}$  and  $\mathcal{V}$ , a praquery  $\mathcal{P} : \mathcal{U} \rightarrow \mathcal{V}$  consists of

- an instance  $\mathcal{P}_0 : \mathcal{U}\mathbf{Inst}$  such that  $\mathcal{P}_0(t) = *$  for all  $t \in \text{Ty}$ ,
- a proquery  $\mathcal{P}_1 : \int \mathcal{P}_0 \rightarrow \mathcal{V}$ .

Given a praquery  $\mathcal{P}$ , get an evaluation functor  $\Gamma_{\mathcal{P}} : \mathcal{V}\mathbf{Inst} \rightarrow \mathcal{U}\mathbf{Inst}$  by

$$\Gamma_{\mathcal{P}}(\mathcal{I})(u) = \sum_{x \in \mathcal{P}_0(u)} \mathcal{V}\mathbf{Inst}(\mathcal{P}_1(x), \mathcal{I}).$$

Praquery  $P$  : “Select the name and (salary + 50) of all employees who are their own manager OR the name and salary of all employees in the Math department”

```
SELECT e.ename AS newname, e.sal + 50 AS newsal,
```

```
FROM e : Emp,
```

```
WHERE e.mgr = e;
```

```
UNION
```

```
SELECT e'.ename AS newname, e'.sal AS newsal,
```

```
FROM e' : Emp,
```

```
WHERE e'.dep.dname = "Math";
```



## New Work

Praquery  $P$  : “Select the name and (salary + 50) of all employees who are their own manager OR the name and salary of all employees in the Math department”

$V$ -Instance  $I$

Emp	mgr	dep	sal	ename
$e_0$	$e_0$	$d_0$	100	“Alice”
$e_1$	$e_2$	$d_1$	50	“Bob”
$e_2$	$e_2$	$d_1$	100	“Charlie”

Dept	sec	dname
$d_0$	$e_0$	“CS”
$d_1$	$e_2$	“Math”

$U$ -Instance  $\text{Eval}_P(I)$

NewEmp	newname	newsal
$e_0$	“Alice”	150
$e_2$	“Charlie”	150
$e'_1$	“Bob”	50
$e'_2$	“Charlie”	100

In our new work we:

- Give a definition of praquery presentation, their semantics and a composition operation.
- Prove correctness of composition of praquery presentations.
- Prove that praqueries can equivalently be described by those functors  $\mathcal{P} : \mathcal{V}\mathbf{Inst} \rightarrow \mathcal{U}\mathbf{Inst}$  that preserve type-algebras and are **parametric right adjoint/prafunctors**.

**Def:** A functor  $F : \mathcal{C} \rightarrow \mathcal{D}$  where  $\mathcal{C}$  has a terminal object  $1$  is called a **parametric right adjoint** if in the factorization

$$\mathcal{C} \xrightarrow{F_1} \mathcal{D}/F(1) \xrightarrow{\Sigma} \mathcal{D}$$

the functor  $F_1$  has a right adjoint.

These kinds of functors have very interesting properties and show up in many places in category theory: [Sha21], [GK12], [NS23].

**Thank you!**

Questions? Comments? Email me at [eminichiello67@gmail.com](mailto:eminichiello67@gmail.com)

Check out implementation of this math using the CQL language at  
<https://www.categoricaldata.net/>

## References

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