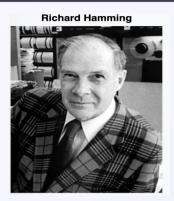


Rethinking Logical Interfaces to Data

Michael Benedikt

includes joint work over the past years with Pierre Bourhis, Louis Jachiet, and Efthymia Tsamoura and joint work with Ehud Hrushovski

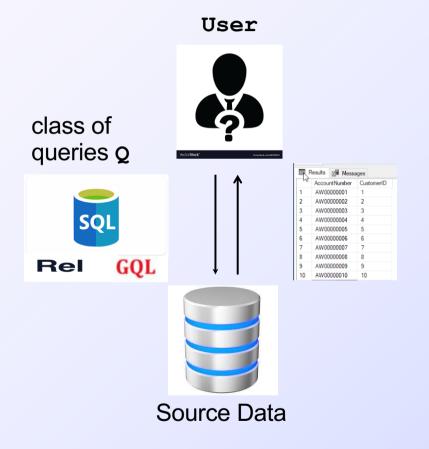
Great Thoughts Fridays.... Thursday warm up



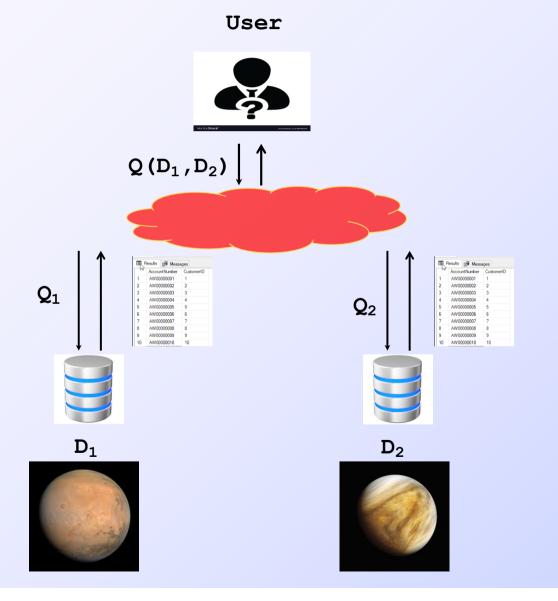
I finally adopted what I called "Great Thoughts Time". When I went to lunch Friday noon, I would only discuss great thoughts after that...

To prepare for great thoughts tomorrow, I'll present some ideas on more flexible/general interfaces to data.

Interface to data: single source



Interface to data: distributed setting



Traditional views

Traditional views are an interface based on making available derived data.

In the distributed setting, for each source s, a view-based interface is a function F_s that takes as input a database instance for the schema of s and produces derived data; a **combination function** stitches derived data from different sources to partially/totally answer the user query.

We call the functions on the local sources *distributed views* (*d-views*).

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Views are often **definable** by logical formulas or a given query language. E.g. a **conjunctive query view** over source **s**:

 $\{\mathbf{x}_1 \ldots \mathbf{x}_m \mid \exists \mathbf{y}_1 \ldots \mathbf{y}_m \mathbf{A}_1 (\mathbf{x}_1 \ldots \mathbf{y}_1 \ldots) \land \ldots \land \mathbf{A}_m (\ldots) \}$

where \mathbf{A}_{i} are atoms over the relations in the local source \mathbf{s} .

Prior interfaces beyond views

Other ways to provide a restricted interface to centralized or integrated data:

- Access patterns: allow access to source data, but require certain values to be specified [Chen Li and Edward Chang; Alan Nash et al.; Deutsch, Nash, Ludascher 2007]
- Views with access patterns [Deutsch, Nash, Ludascher 2007; Romero, Preda, Amarilli, Suchanek 2020]
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- Specification of allowed queries via automata [Cautis, Deutsch, Onose, TOCS 2010]
- Minimal information to support a target query [B., Bourhis, Jachiet, Tsamoura KR 2020/TODS 2022]
- Generalizing views via indistinguishability [B. & Hrushovski 2023]

Minimally informative query answering

We specify a set of queries $Q_1 \dots Q_k$ ("utility queries") that we want to support, and ask for the **minimally informative views** (within a class) that **support these queries**.







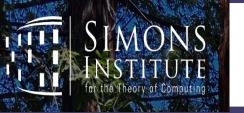
Dagstuhl and the Simons Institute want to support access to their independent datastores Simons Dagstuhl

SimonsParticipant(name,program,year)

DagstuhlParticipant(name,progam,year)

They want the interface to support answering some queries that span sources, like asking if there are researchers attending programs at both venues the same year.

Q =∃program₁ ∃program₂ ∃name ∃year SimonsParticipant(name, program₁, year) ∧ DagstuhlParticipant(name, program₂, year)





Schloss Dagstuhl Where Computer Scientists Meet

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How do we formalize the notion of support and minimal information?





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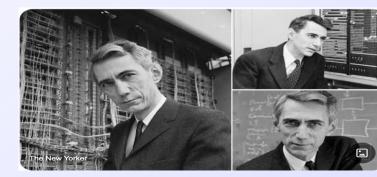
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 YouTube • University of California Tel...
 Claude Shannon - Father of the Information Age
 Considered the founding father of the electronic communication age, Claude...
 Jan 17, 2008 Intuitively Understanding The Shannon Entropy

 $H(X) = -\sum_{i} P(x_i) \log P(x_i)$







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 Image: Constrained in the provide interval of t

Formalization: supporting a query



What formalize the notion that the views support queries $Q_1 \dots Q_u$ using Segoufin and Vianu's notion of determinacy.

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Given a query Q and views $v_1 \dots v_t$ we say Q is **determined** by $v_1 \dots v_t$ if:

for all input D, D' with V_1 (D) = V_1 (D'), ... V_t (D) = V_t (D') we have Q (D) =Q (D')

We say that d-view $v_1 \dots v_t$ supports Q if Q is determined by $v_1 \dots v_t$.

Read as " $v_1 \dots v_t$ contains all the information needed for Q''

Formalization: minimal information

We formalize the notion that the views are minimally informative using

Formalization: minimal information

We formalize the notion that the views are minimally informative using Segoufin and Vianu's notion of determinacy.

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We say a d-view v is a *minimally informative supportive d-view* for query Q within a class of queries C if:

• v supports Q

• v is based on queries in c and for every other d-view v' using queries from c that supports Q, we have v' determines each view in v





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The minimal information d-views that support this query are the obvious ones:

Simons should publish the view: ∃program SimonsParticipant(name, program, year)

While Dagstuhl should publish the view: Jprogram DagstuhlParticipant(name, program, year)

Example of our results

Theorem [B., Bourhis, Jachiet, Tsamoura] For **any** utility queries, minimally informative **d**-views exist, and for **CQ** utility queries they are expressible as traditional views in relational algebra. The same holds in the presence of integrity constraints on each local source.

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 $Q = \exists x \exists y R(x, y) \land S(x, y) \land T(x, y)$

Clearly, we can design views at each source to answer **Q**: each source just exports its data.

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Intuitively, any views (no matter what query language) that allow Q to be answered must disclose p on some instance. Using the prior theorem, we can prove this.

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There is a partial synchronization between Simons and Dagstuhl: **s** is replicated between the two sources.

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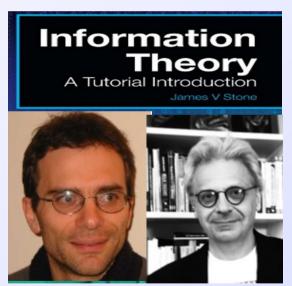
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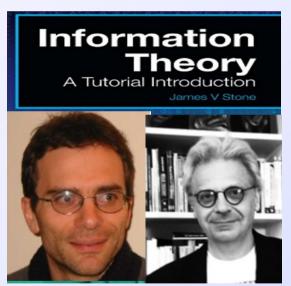
Tentative moral on minimal information querying

- Compare the expressiveness of different interface mechanisms.
- Develop the notion of determinacy from Segoufin and Vianu as a metric to perform this comparison.



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Also used in query pricing [Koutris, Upadhyaya, Howe, Balazinska, Suciu JACM 2015] and in other work on information disclosure [B., Bourhis, ten Cate, Puppis, Vanden Boom TOCL 2021; B., Cuenca Grau, Kostylev JAIR 2018]

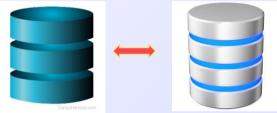
Interfaces beyond views

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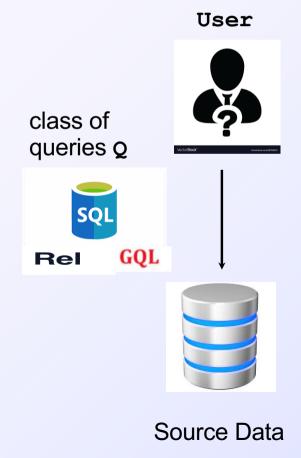
Generalizing views via database indistinguishability

An **indistinguishability relation** is an equivalence relation on databases. This defines an interface.



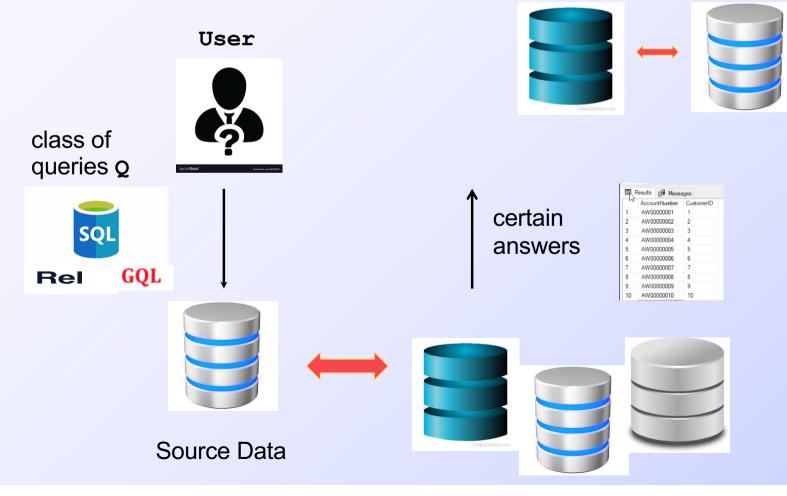
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Example:

Declare graph databases G and G' indistinguishable if they have the same triangles:

 $\forall \mathbf{x}_1 \, \mathbf{x}_2 \, \mathbf{x}_3 \\ [(G(\mathbf{x}_1, \mathbf{x}_2) \land G(\mathbf{x}_2, \mathbf{x}_3) \land G(\mathbf{x}_2, \mathbf{x}_3)) \leftrightarrow (G'(\mathbf{x}_1, \mathbf{x}_2) \land G'(\mathbf{x}_2, \mathbf{x}_3) \land G'(\mathbf{x}_2, \mathbf{x}_3))]$

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A first order definable indistinguishability relation is given by φ a first order sentence in the language of **two copies of the schema**. Thus φ defines a collection of pairs of databases. If φ defines an equivalence relation, then φ provides an indistinguishability relation.

Note: a typical first order φ will **not** define an equivalence relation on databases. For example, transitivity will fail.

An indistinguishability relation is an equivalence relation on databases.

A first order definable indistinguishability relation is given by φ a first order sentence in the language of **two copies of the schema** which happens to define an equivalence relation.

Class of examples of FO indistinguishability:

Traditional relational algebra views $v_1 \dots v_{\kappa}$ give a first order indistinguishability relation:

 $\forall \mathbf{x}_1 \dots \mathbf{x}_j \ [\Lambda_{i \leq k} \ V_i (\mathbf{x}_1 \dots \mathbf{x}_j) \leftrightarrow V'_i (\mathbf{x}_1 \dots \mathbf{x}_j)]$ where V'_i is a copy of V_i on the primed signature.

Recall: building interfaces beyond traditional views

Theorem [B., Bourhis, Jachiet, Tsamoura] For any utility queries, minimally informative d-views exist as an indistinguishability relation. For CQ utility queries they are expressible as traditional views in relational algebra. The same holds in the presence of integrity constraints on each local source.

Recall: building interfaces beyond views

These tools allow us to analyze questions of the form "are there distributed views that support query \mathbf{Q} but which do not reveal any information about query \mathbf{p}''





There is a partial synchronization between Simons and Dagstuhl: **s** is replicated between the two sources.

$Q = \exists x y R(x, y) \land S(x, y) \land T(x, y)$

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But suppose we want to keep the following query private: $p = \exists x R(x,x)$

It **is** possible to support **Q** without revealing **p**. But we will need an interface mechanism beyond relational algebra views - namely, an indistinguishability relation.

Super-generalizing views via database indistinguishability

An **indistinguishability relation** is an equivalence relation on databases. It can be thought of as an "abstract view": we are exporting the equivalence class of a database.

This is a super-general notion.

In current work with Hrushovski we study it primarily in the setting of **classical model theory**: indistinguishability relations over **infinite structures**, focusing on relations definable in **first order and infinitary logic**. Motivated by classification theory, descriptive set theory, model theory for topology and analysis.

But there are some results for first order indistinguishability relations on databases/finite models.

A first order definable indistinguishability relation is given by φ a first order sentence in the language of two copies of the schema which happens to define an equivalence relation.

Recall:

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Indistinguishibility versus query-based views

A first order definable indistinguishability relation is given by φ a first order sentence in the language of **two copies of the schema** which happens to define an equivalence relation.

Traditional **nested relational calculus views** $v_1 \dots v_{\kappa}$ give a first order indistinguishability relation.

Example: Given binary $\mathbb{R}(\mathbf{x},\mathbf{y})$, consider the view corresponding to the nested query $\{\{\mathbf{y} \mid (\mathbf{x},\mathbf{y}) \in \mathbb{R}\} \mid \mathbf{x} \in \pi_1(\mathbb{R})\}$ That is, \mathbb{R} and \mathbb{R}' are indistinguishable if they have the same adjacency sets of nodes.

 $\forall \mathbf{x} \ \exists \mathbf{x}' [\forall \mathbf{y} \ \mathbf{R} (\mathbf{x}, \mathbf{y}) \leftrightarrow \mathbf{R}' (\mathbf{x}', \mathbf{y})] \land \\ \forall \mathbf{x}' \ \exists \mathbf{x} [\forall \mathbf{y} \ \mathbf{R} (\mathbf{x}, \mathbf{y}) \leftrightarrow \mathbf{R}' (\mathbf{x}', \mathbf{y})]$

Indistinguishibility versus query-based views

Let **E** be an "indistiguishability relation": an equivalence relation on databases. **E** can be thought of as an "abstract view".

A first order definable indistinguishability relation is given by φ a first order sentence in the language of two copies of the schema. Thus φ defines a collection of pairs of databases, and we require φ to define an equivalence relation.

Traditional **nested relational calculus views** $v_1 \dots v_{\kappa}$ give a first order indistinguishability relation.

Example: Given ternary R(x,y,z), consider the view corresponding to the nested query

```
 \left\{ \begin{array}{ll} \left\{ z \mid (x,y,z) \in R \right\} & \ \left\{ adjacency \ set \ of \ x,y \\ y \in \pi_2(R) \right\} & \ \left\{ set \ of \ adjacency \ sets \ for \ x \\ \mid x \in \pi_1(R) \right\} & \ \left\{ set \ of \ sets \ of \ adjacency \\ \end{array} \right.
```

sets

That is, **R** and **R'** are indistinguishable if they have the same sets of sets of adjacency sets of pairs.

Separation

Hierarchy Theorem [B., Hrushovski]

For every n, there are depth n nested relational views whose indistinguishability relation is not given by depth n-1 nested relational views.

Collapse of Nested Relational Views to Relational Views

Sparse Collapse Theorem [B., Hrushovski]

Suppose \mathbf{E} is given by a set of nested relational views on a graph database. Suppose \mathbf{C} is a collection of graphs that exclude a minor. Then over \mathbf{C} , \mathbf{E} is given by a set of relational algebra views.

Prefix Classes of FO Indistinguishability Relations

Can classify FO Indistinguishability relations by the quantifier alternation, focusing only on the quantified variables that vary over both models.

E.g. Triangle-based equivalence example is $\Pi_1 : \forall \mathbf{x}_1 \ \mathbf{x}_2 \ \mathbf{x}_3 \ ...$ The first nested relational calculus example (adjacency sets) is $\Pi_3 : \forall \mathbf{x}_1 \ ... \exists \mathbf{y}_1 \ ... \forall \mathbf{z}_1 \ ...$

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Π₂ Theorem [B., Hrushovski]

Suppose \mathbf{E} is a $\mathbf{\Pi}_2$ indistinguishability relation: given by a $\forall \mathbf{x}_1 \dots \exists \mathbf{y}_1 \dots$ sentence in two copies of the signature, that happens to define an equivalence relation, showing here only the quantifiers of variables that span both models. Then \mathbf{E} is a $\mathbf{\Pi}_1$ indistinguishability relation: given by a universal sentence.

First Order Indistinguishability and Nested Relations

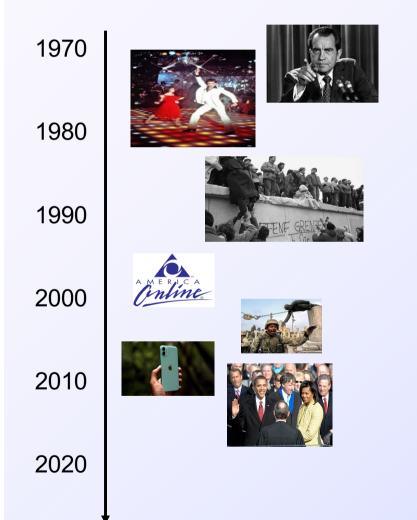
Question: Is every first order indistinguishability relation is given by nested relational calculus views?

Tentative Moral on Indistinguishability Relations

- Indistinguishability relations make the world of traditional view interfaces look very small
- Issue of converting between interface specifications of different natures.
 In this case, from a compactedly-represented equivalence class to a canonical representative.

Many analogies in descriptive complexity theory and descriptive set theory.

Lead-In To Great Thoughts Friday



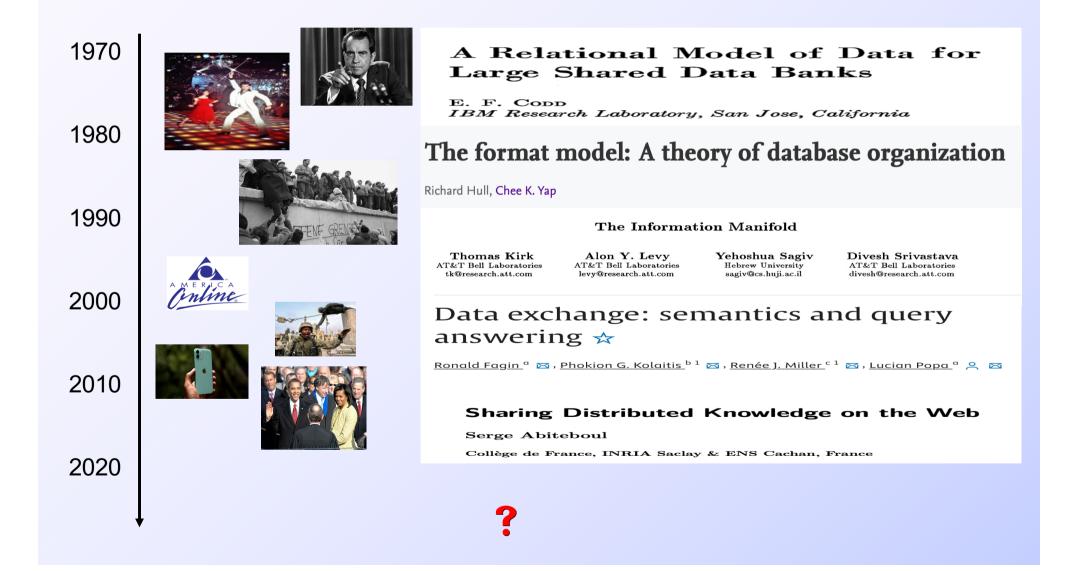
Relational databases have been around for over 50 years.

And in the first 40 years, the notion of logical interface today and notions of comparing interfaces were frequently revisited, often radically so.

Lead-In To Great Thoughts Friday



Lead-In To Great Thoughts Friday





When you need more complicated views



Query to support specified as

 $Q = \exists x y R(x,y) \land S(x,y) \land S(y,x)$



When you need more complicated views





Query to support specified as

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Minimal information supporting view at the Simons source:

 $\mathtt{S}(\mathtt{x}\,, \mathtt{y}) \lor \mathtt{S}(\mathtt{y}\,, \mathtt{x})$