



When Can We Answer Queries Using Result-Bounded Data Interfaces?

Antoine Amarilli¹, Michael Benedikt²

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¹Télécom ParisTech

²Oxford University

Problem: Answering Queries Using Web Services

Directory serviceDBLP serviceImage: DBLP service

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- \rightarrow How can we **rephrase** the query against the Web services?

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Find all papers written by researchers from my department? $Q(t) : \exists a y \text{ Directory}(MyDept, a) \land DBLP(a, t, y)$

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Constraints: express logical relationships between the services

- Every researcher from the directory is in DBLP
- $\Sigma: \forall d a \text{ Directory}(d, a) \rightarrow \exists t y \text{ DBLP}(a, t, y)$

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What is a **monotone plan**?

- Access the **services** by giving **bindings**
- Evaluate monotone relational algebra
- The plan is correct if it returns Q(D) on any database D that satisfies Σ

Example:

 $T_1 \leftarrow \text{Directory} \leftarrow \text{MyDept};$

$$T_2 \leftarrow \text{DBLP} \leftarrow \pi_{\text{person}}(T_1);$$

$$T_3 \Leftarrow \pi_{\text{title}}(T_2);$$

Return T₃

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Generating Plans from Proofs The Interpolation-based Approach to Query Reformulation

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Michael Benedikt Julien Leblay Balder ten Cate Efthymia Tsamoura **Extensive literature** about how to reformulate queries to monotone plans and about the **complexity** depending on the constraint language

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New Challenge: Result Bounds

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Currently the following URL query parameters are recognized:

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q	The query string to search for.
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Formalization: DBLP(author, title, year) has a result bound of 1000

- If an access matches \leq 1000 tuples then they are **all** returned
- If it matches > 1000 tuples then we get 1000 of them (random)

\rightarrow How to reformulate queries using result-bounded services?

Input:

- Service schema S of relation names and attributes with input attributes and optionally a result bound
 - \rightarrow Directory(<u>department</u>, person)
 - \rightarrow DBLP(<u>author</u>, title, year) with bound 1000
- Conjunctive query Q
 - $\rightarrow Q(t) : \exists a y \text{ Directory}(MyDept, a) \land DBLP(a, t, y)$
- Constraints $\boldsymbol{\Sigma}$

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We study:

- → What is the **complexity** of deciding plan existence, depending on the constraint language?
- \rightarrow In which ways are result-bounded services useful?

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Inclusion dependencies (IDs)	Existence-check	EXPTIME-complete
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FDs and UIDs	Choice	NP-hard, in EXPTIME
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 \rightarrow Let's see the schema simplification results and proof techniques $_{_{7/16}}$

- Schema: DBLP(author, title, year) with bound 1000
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- For each relation DBLP(<u>author</u>, title, year) with a result bound, create a new relation DBLP_{check}(<u>author</u>)
- Add two IDs in **Σ** to relate **DBLP**_{check} and **DBLP**:

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• Forbid direct accesses to DBLP (so the result bound is irrelevant)

Theorem

Any schema **S** with constraints Σ in **Inclusion dependencies** (IDs) is **existence-check simplifiable**

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As the existence-check approximation has **no result bounds**, we can reduce to the classical setting and deduce:

Corollary

For any schema **S** with result bounds, **ID** constraints Σ , and query **Q**, deciding the existence of a monotone plan is **EXPTIME-complete**

FD Simplification

Result-bounded services can **do more** than existence checks:

- Schema *S*: directory that returns **addresses** and **phone numbers**
 - \rightarrow Dir2(<u>name</u>, address, phone) with bound 1000

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- For each relation Dir2(name, address, phone) with result bound, create a new relation $Dir2_{FD}(name, address)$ that outputs the attributes determined in Σ by the input attributes
- Forbid accesses on Dir2 and add IDs with Dir2_{FD} like before $\forall n \ a \ Dir2_{FD}(n, a) \leftrightarrow \exists p \ Dir2(n, a, p)$

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Any schema S with constraints Σ in Functional dependencies (FDs) is FD simplifiable

→ Under FDs, result-bounded services are only useful to access outputs that are **functionally determined** (i.e., we are guaranteed to have only one result)

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Again, there are **no result bounds** left in the FD approximation, so we can use this result to show:

Corollary

For any schema **S** with result bounds, **FD** constraints Σ , and query **Q**, deciding the existence of a monotone plan is **NP-complete**

With expressive constraints, the FD approximation is not enough:

Lemma

There is a service schema *S*, query *Q*, and TGDs Σ such that *Q* is **not FD-simplifiable** (hence, not **existence-check-simplifiable**)

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There is a service schema *S*, query *Q*, and *TGDs* Σ such that *Q* is **not FD-simplifiable** (hence, not **existence-check-simplifiable**)

A less drastic simplification is the **choice simplification**:

• For every service with a result bound, change the bound to be 1

 \rightarrow Intuition: It's important to get some tuple if one exists

Choice Simplification Results

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For any schema **S** with result bounds, query **Q**, and **FGTGDs** Σ deciding the existence of a monotone plan is **2EXPTIME-complete**

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We can also show choice approximability for another fragment:

Theorem

Any schema S with constraints Σ that are FDs and $unary \, IDs$ (UIDs) is choice simplifiable

ightarrow This implies that plan existence is **decidable** for FDs and UIDs

- Show that result bounds can be axiomatized in **simpler ways**:
 - Ensure that doing the same access twice returns the same result
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- Reduce to query containment under constraints

ightarrow Study the result of the translation to show complexity bounds

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- Results for **non-monotone plans** (= with relational difference)
- Example of FO constraints that are **not choice simplifiable**

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Thanks for your attention! 16/16



Benedikt, M., Leblay, J., Cate, B. t., and Tsamoura, E. (2016). Generating plans from proofs: the interpolation-based approach to query reformulation.

Morgan & Claypool.