Answering Queries Determined by Views

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Abstract

Answering queries using views is the problem which examines how to derive the answers to a query when we only have the answers to a set of views. In this paper we investigate this problem in the case where the answers to the views uniquely determine the answers to the query. We say that a view set V determines a query Q if for any two databases D_1, D_2 it holds: $\mathcal{V}(D_1) = \mathcal{V}(D_2)$ implies $Q(D_1) = Q(D_2)$. We consider the case where query and views are defined by conjunctive queries. We ask the question: If a view set V determines a query Q, is there an equivalent rewriting of Q using Clearly if we can find an equivalent rewriting then the complexity of answering the queries given a view instance is polynomial. In this paper we show that computing the answers to queries determined by views is in $NP \cap coNP$. We find cases, (such as chain queries, views without nondistinguished variables) where if a query is determined by a view set then there is an equivalent rewriting, hence the complexity of answering the query on a view instance is polynomial. We reduce the general problem to special cases (such as boolean queries, binary base predicates). We introduce a problem which is a special case of the general problem and relates determinacy to query equivalence.

1 Introduction

The problem of using materialized views to answer queries [LMSS95] has received considerable attention because of its relevance to many data-management applications, such as information integration [B⁺97, C⁺94, HKWY97, IFF⁺99, LRO96, Ull97], data warehousing [TS97],[ACN00] web-site designs [FLSY99], and query optimization [CKPS95]. The problem can be stated as follows: given a query Q on a database schema and a set of views $\mathcal V$ over the same schema, can we answer the query using only the answers to the views, i.e., for any

database D, can we find Q(D) if we only know $\mathcal{V}(D)$?

A related fundamental question has recently arisen which is related to the information that is provided by a set of views for a specific query [SV05]. Thus, we say that a set \mathcal{V} of views determines a query Q if for any two databases D_1, D_2 it holds: $\mathcal{V}(D_1) = \mathcal{V}(D_2)$ implies $Q(D_1) = Q(D_2)$. A database query Q can be thought of as defining a partition of the set of all databases in the sense that databases on which the query produces the same set of tuples in the answer belong to the same equivalence class. In the same sense a set of views defines a partition of the set of all databases. Thus, if a view set \mathcal{V} determines a query Q, then the views' partition is a refinement of the partition defined by the query. Thus if we are given $\mathcal{V}(D)$ only, then we can "find" Q(D) by noting the equivalence class of $\mathcal{V}(D)$ and seeing what Q computes on that equivalence class. However, it is not easy to see whether the mapping from the views' equivalence class to the query equivalence class is even computable. We show in this paper that if a CQ view set determines a CQ query then computing the answers to the query is in $NP \cap coNP$.

A large amount of work in answering queries using views concerns finding rewritings of queries using a set of views. When there is an equivalent rewriting of a query Q using a set of views \mathcal{V} then \mathcal{V} determines Q. How about the converse? Given that V determines Q, can we say that there exists an equivalent rewriting of Q using \mathcal{V} ? The existence of rewritings depend on the language of the rewriting and the language of the query and views. Given query languages \mathcal{L} , $\mathcal{L}_{\mathcal{V}}$, \mathcal{L}_{Q} we say that a language \mathcal{L} is *complete* for $\mathcal{L}_{\mathcal{V}}$ -to- $\mathcal{L}_{\mathcal{Q}}$ rewritings if whenever a set of views V in \mathcal{L}_{V} determines a query Q in \mathcal{L}_Q then there is a rewriting of Q in \mathcal{L} which uses only \mathcal{V} . In [SV05] this problem is investigated and is shown that there are cases where a certain language is not complete, e.g., it is shown that the language of union of conjunctive queries (UCQ) is not complete for UCQ-

to-UCQ rewritings. However it is noticed that a hard case to settle and hence an open problem is whether the language of conjunctive queries (CQ) is complete for CQ-to-CQ rewritings. In this paper we answer this question positively in special cases and also we show that some special cases are as hard to resolve as the general problem by reducing the general problem to them. Finally we introduce a seemingly simpler problem that relates determinacy and query equivalence which also remains open, whereas here we solve a special case of it.

The organization and the contribution of the paper are as follows: In Section 3 we show that if the views determine the query then the query answering problem is in $NP \cap coNP$. In Section 4 we prove that there is an algorithm to find an equivalent rewriting in case there exists one. In particular, we show that if there is an equivalent rewriting then the canonical rewriting We show how to construct a is such a rewriting. canonical rewriting. In Section 5 we present three special cases of CQ-to-CQ rewritings for which CQ is complete. The special cases are: when views have no nondistinguished variables, when views and query are chain queries and when the query has a single variable and the view set contains a single view with one nondistinguished variable. Hence, in these special cases the query answering problem is in PTIME. A summary of all CQ cases for which we know that CQ is complete is in Table 1.

In Section 6 we ask the question: If a single view determines the query then are there some natural conditions to add so that the query and view are equivalent? We identify such conditions and show that if they hold for a view and query then the following is true: If CQ is complete for CQ-to-CQ rewritings, and the view determines the query, then the view and query are equivalent. Thus we have a new variant of the problem which, although it seems like an "easier" problem to solve, this also remains open; here we solve a special case of it. In Section 7 we reduce the original problem to a special case where, if an equivalent rewriting exists then it is a projection of a single view. In Section 8 we present more reductions of the general problem to special cases, such as when we use only binary base predicates and when the query is Boolean. We also include a reduction which addresses connectivity issues related to determinacy. A complete version of this paper can be found in [Afr].

1.1 Related Work In [SV05], the problem of determinacy is investigated for many languages including first order logic and fragments of second order logic and a considerable number of cases are resolved. The results closer to our setting show that if a language \mathcal{L} is complete of UCQ-to-UCQ (i.e., unions of CQs) rewrit-

ings, then $\mathcal L$ must express non-monotonic queries. Moreover, this holds even if the database relations, views and query are restricted to be unary. This says that even Datalog is not complete for UCQ-to-UCQ rewritings. Datalog is not complete even for CQ^{\neq} -to-CQ rewritings. For CQ query and views, it is shown in [SV05] that CQ is complete for CQ-to-CQ rewritings iff whenever a set of views $\mathcal V$ determines a query Q over finite instances then $\mathcal V$ determines Q over unrestricted (i.e., may be infinite too) instances. They also prove that for unary or Boolean CQ views, then CQ is complete for CQ-to-CQ rewritings. For the unrestricted case, they prove that CQ is complete for CQ-to-CQ rewritings, however no monotonic language is complete for UCQ-to-UCQ rewritings.

Determinacy and notions related to it are also investigated in [GT00] where the notion of subsumption is introduced and used to the definition of complete rewritings and in [CdGLV02] where the concept of lossless view with respect to a query is introduced and investigated both under the sound view assumption (a.k.a. open world assumption) and under the exact view assumption (a.k.a. closed world assumption) on regular path queries used for semi-structured data. Losslessness under the CWA is identical to determinacy. There is a large amount of work on equivalent rewritings of queries using views. It includes [LMSS95] where it is proven that it is NP-complete whether a given CQ query has an equivalent rewriting using a given set of CQ views, [CR97] where polynomial subcases were identified. In [RSU95], [ALM02], [DG97] cases were investigated for CQ queries and views with binding patterns, arithmetic comparisons and recursion, respectively. In some of these works also the problem of maximally contained rewritings is considered. Intuitively, maximally contained rewritings is the best we can do when there is no equivalent rewriting and want to obtain a query that uses only the views and computes as many certain answers [AD98] as possible. In [LBU] the notion of p-containment and equipotence is introduced to characterize view sets that can answer the same set of queries. Answering queries using views in semi-structured databases is considered in [CdGLV02] and references therein.

2 Preliminaries

2.1 Basic Definitions We consider queries and views defined by conjunctive queries (CQ for short) (i.e., select-project-join queries) in the form:

$$h(\bar{X}): -g_1(\bar{X}_1), \dots, g_k(\bar{X}_k).$$

Each subgoal in the body is a relational atom. In each subgoal $g_i(\bar{X}_i)$, predicate g_i defines a base relation (we use the same symbol for the predicate and the relation), and every argument in the subgoal is either a variable

Query	Views	Reference
any	without nondistinguished	this paper
any	unary	[SV05]
any	boolean	[SV05]
single variable	single view, binary, 1 nondist.	* this paper
chain	chain	* this paper

Table 1: Summary of polynomial cases: CQ is a complete language for rewritings for the listed subcases of CQ queries and views. The cases with asterisk (*) assume binary base predicates.

or a constant. A variable is called distinguished if it appears in the head. We shall use names beginning with lower-case letters for constants and relations, and names beginning with upper-case letters for variables. We use V, V_1, \ldots, V_m to denote views that are defined by conjunctive queries on the base relations. We say that a CQ is minimized if there are not redundant subgoals, i.e, if we delete any subgoal then we obtain a query which is not equivalent to the original query. In the rest of this paper, we consider wlog minimized queries and views.

A relational structure is a set of atoms over a domain of variables and constants. A relational atom with constants in its arguments is called a ground atom. A database instance is a relational structure with only ground atoms. The body of a conjunctive query can be also viewed as a relational structure. A homomorphism is a mapping from the variables and constants of a relational structure S_1 to the variable and constants of another relational structure S_2 so that an atom of S_1 maps on an atom of S_2 with the same predicate name.

DEFINITION 2.1. (canonical database of query) A canonical database D_Q of conjunctive query Q is derived by freezing the variables of Q to distinct constants and adding in D_Q exactly all frozen subgoals in the body of Q.

For minimized queries canonical database is unique up to renaming. We will use the notation D_Q to denote the canonical database of query Q without mentioning it

DEFINITION 2.2. (query containment and equivalence) A query Q_1 is contained in a query Q_2 , denoted $Q_1 \sqsubseteq Q_2$, if for any database D of the base relations, the answer computed by Q_1 is a subset of the answer by Q_2 , i.e., $Q_1(D) \subseteq Q_2(D)$. The two queries are equivalent, denoted $Q_1 \equiv Q_2$, if $Q_1 \sqsubseteq Q_2$ and $Q_2 \sqsubseteq Q_1$.

Chandra and Merlin [CM77] show that a conjunctive query Q_1 is contained in another conjunctive query Q_2 if and only if there is containment mapping from Q_2 to Q_1 . A containment mapping is a homomorphism which maps the head and all the subgoals in Q_2 to Q_1 . It maps each variable to either a variable or a constant, and maps each constant to the same constant.

DEFINITION 2.3. (expansion of a query using views) The expansion of a query P on a set of views V, denoted P^{exp} , is obtained from P by replacing all the views in P with their corresponding base relations. Existentially quantified variables (i.e., nondistinguished variables) in a view are replaced by fresh variables in P^{exp} .

We denote by $\mathcal{V}(D)$ the result of computing the views on database D, i.e., $\mathcal{V}(D) = \bigcup_{V \in \mathcal{V}} V(D)$.

DEFINITION 2.4. (equivalent rewritings) Given a query Q and a set of views V, a query P is an equivalent rewriting of query Q using V, if P uses only the views in V, and for any database D on the schema of the base relations it holds: P(V(D)) = Q(D).

For conjunctive queries and views the following is shown to be an equivalent definition.

DEFINITION 2.5. (equivalent rewritings) Given a query Q and a set of views V, a query P is an equivalent rewriting of query Q using V, if P uses only the views in V, and P^{exp} is equivalent to Q, i.e., $P^{exp} \equiv Q$.

A CQ query is called *chain query* if it is defined over binary predicates and also the following holds: The body contains as subgoals a number of binary atoms which if viewed as labeled graph (since they are binary) they form a directed path and the start and end nodes of this path are the arguments in the head. For an example, this is a chain query: q(X,Y): $-a(X,Z_1,b(Z_1,Z_2),c(Z_2,Y)$.

2.2 Determinacy For two databases D_1, D_2 , $\mathcal{V}(D_1) = \mathcal{V}(D_2)$ means that for each $V_i \in \mathcal{V}$ it holds $V_i(D_1) = V_i(D_2)$.

DEFINITION 2.6. (views determine query) Let query Q and views V. We say that V determines Q if the following is true: For any pair of databases D_1 and D_2 , if $V(D_1) = V(D_2)$ then $Q(D_1) = Q(D_2)$.

Thus if a set of views \mathcal{V} determines a query Q, then, given a view instance $I_{\mathcal{V}}$ we know that for any database D such that $I_{\mathcal{V}} = \mathcal{V}(D)$ the answer to the query Q(D) depends only on $I_{\mathcal{V}}$, hence we write $Q(I_{\mathcal{V}})$ to denote it.

The following example shows a view set and two queries, one query being determined by the view set the other query not.

EXAMPLE 2.1. (i) Consider query:

$$Q: q(X,Y): -a(X,Z_1), a(Z_1,Z_2), b(Z_2,Y).$$

and views:

$$V_3: v_3(X,Y): -a(X,Z_1'), a(Z_1',Z_2), b(Z_2,Y).$$

$$V_4: v_4(X): -b(X, X).$$

View set $\{V_3, V_4\}$ determines Q because V_3 is equivalent to Q.

(ii) Now consider query

$$Q': q'(X,Y): -a(X,X), b(X,Y).$$

View set $\{V_3, V_4\}$ does not determine Q' and also there is no rewriting of Q' using $\{V_3, V_4\}$. To see that $\{V_3, V_4\}$ does not determine Q', consider the databases $D_1 = \{a(x, z_1'), a(z_1', z_2), b(z_2, y)\}$ and $D_2 = \{a(x, x), b(x, y)\}$. The output of the view computation is the same, i.e., $\mathcal{V}(D_1) = \mathcal{V}(D_1) = \{v_3(x, y)\}$ but on D_2 query Q' computes $Q'(D_2) = \{q'(x, y)\}$ and on D_1 query Q' computes the empty set.

DEFINITION 2.7. (complete language for rewritings) Let \mathcal{L}_Q and $\mathcal{L}_{\mathcal{V}}$ and \mathcal{L} be query languages. We say that a language \mathcal{L} is complete for $\mathcal{L}_{\mathcal{V}}$ -to- \mathcal{L}_Q rewritings if the following is true for any query Q in \mathcal{L}_Q and set of views \mathcal{V} in $\mathcal{L}_{\mathcal{V}}$: Suppose \mathcal{V} determines Q; then there is a query R in \mathcal{L} such that R is an equivalent rewriting of Q using \mathcal{V}

The following proposition states some easy observation about query and views when the views determine the query.

PROPOSITION 2.1. Let query Q and views V be given by minimized conjunctive queries. Suppose V determines Q.

Let Q' be query resulting from Q after deleting one or more subgoals. Let D_Q and $D_{Q'}$ be the canonical databases of Q and Q' respectively. Then the following hold:

- a) $\mathcal{V}(D_Q) \neq \mathcal{V}(D_{Q'})$.
- b) For any database D, the constants in the tuples in Q(D) is a subset of the constants in the tuples in $\mathcal{V}(D)$.
- c) All base predicates appearing in the query definition appear also in the views (but not necessarily vice versa).
 - d) $\mathcal{V}(D_Q) \neq \emptyset$.

Proof. The proof of the first part of the claim is by contradiction: If not, then $\mathcal{V}(D_Q) = \mathcal{V}(D_{Q'})$ and consequently $Q(D_Q) = Q(D_{Q'})$. Hence there is a homomorphism from Q to $D_{Q'}$ which yields a containment mapping from the subgoals of Q to the subgoals of Q', which is a contradiction. For the second part, suppose x is a constant in Q(D) which does not appear in $\mathcal{V}(D)$. Then let us construct D_1 and D_2 to be isomorphic to D only that in D_1 we have renamed the constant x to c where c is not used again in either D_1 or D_2 . Now we have $\mathcal{V}(D_1) = \mathcal{V}(D_2)$ but there is a tuple in $Q(D_1)$ which contains c and there is no such tuple in $Q(D_2)$. Hence $Q(D_1) \neq Q(D_2)$ contradiction.

To prove the third part, suppose p_i is the predicate name which appears in the query but does not appear in the views definition. Consider the canonical database D_Q of the query and a database D' which results from D_Q after deleting any fact $p_i(t)$. Then on both D and D' the views compute the same relations but the query does not. The fourth part is a consequence of a similar construction, now D' is empty. Then again, on both D and D' the views compute the same relations but the query does not. \dashv

It is easy to show that if there is an equivalent rewriting of a query using a set of views then this set of views determine the query.

PROPOSITION 2.2. Let Q and \mathcal{V} be query and views which are conjunctive. If there is an equivalent rewriting of Q using \mathcal{V} then \mathcal{V} determines Q.

Proof. Let P be an equivalent rewriting of Q using \mathcal{V} . Let D_1 and D_2 be databases such that $\mathcal{V}(D_1) = \mathcal{V}(D_2)$. Then $P(\mathcal{V}(D_1)) = P(\mathcal{V}(D_2))$. Since P is an equivalent rewriting, this yields that $Q(D_1) = Q(D_2)$.

3 Complexity of Query Answering

The following theorem shows that, in the case the views determine the query, then the query answering problem is in $NP \cap coNP$.

THEOREM 3.1. Let query Q and views V be given by conjunctive queries. Suppose V determines Q. If we are given a view instance I_V such that there exists a database D for which $I_V = V(D)$, then computing $Q(I_V)$ is in $NP \cap conP$.

Proof. Let a tuple t be given. We want to decide whether $t \in Q(I_{\mathcal{V}})$ or not. We will show that for every $I_{\mathcal{V}}$ there exists at least one database D_h of polynomial size such that $I_{\mathcal{V}} = \mathcal{V}(D_h)$. Hence we can decide by computing $Q(D_h)$.

We construct a database D' over the base relations. We "expand" $I_{\mathcal{V}}$ to D' (recall that $I_{\mathcal{V}}$ is over the schema of the views) by replacing each view tuple by a set of tuples of base relations which are the frozen subgoals of this view's definition. More specifically, nondistinguished variables in the view definition are frozen to fresh constants that are not used for any other frozen variable. (This construction is similar to the construction which obtains the expansion of a rewriting.)

Let D be any database such that $I_{\mathcal{V}} = \mathcal{V}(D)$. Clearly there is a homomorphism from D' to D. Also, for any database D_i such that $\mathcal{V}(D) = \mathcal{V}(D_i)$ if D_i is minimal (in the sense that if we delete one tuple from D_i then $\mathcal{V}(D) \neq \mathcal{V}(D_i)$), then D_i is a homomorphic image of D'. Thus, consider all databases that are homomorphic images of D'. Among those there exists at least one, say D_h , such that $I_{\mathcal{V}} = \mathcal{V}(D_h)$. To compute $Q(I_{\mathcal{V}})$ just compute $Q(D_h)$.

The above reasoning puts the problem in $NP \cap coNP$: The size of any homomorphic image of D' is polynomial in the size of $I_{\mathcal{V}}$. Thus, we guess a homomorphic image D_h of D'. Then in polynomial time, we compute the views \mathcal{V} on D_h and verify that it is equal to $I_{\mathcal{V}}$. Finally we compute Q on D_h . \dashv

4 Canonical Rewriting

In this section we show that given a query and views that are defined by conjunctive queries, then there is a particular conjunctive query R_c which uses only view atoms as subgoals which has the property: If there is an equivalent rewriting then R_c is an equivalent rewriting.

Let D_Q be the canonical database of Q. We compute the views on D_Q and get view instance $\mathcal{V}(D_Q)$ [ALU01]. We construct canonical rewriting R_c as follows. The body of R_c contains as subgoals exactly all unfrozen view tuples in $\mathcal{V}(D_Q)$ and the tuple in the head of R_c is as the tuple in the head of query Q. Here is an example which illustrates this construction.

EXAMPLE 4.1. Suppose we have the query:

$$Q: q(X,Y): -a(X,Z_1), a(Z_1,Z_2), b(Z_2,Y).$$

and the views V:

$$V_1: v_1(X, Z_2): -a(X, Z_1), a(Z_1, Z_2).$$

$$V_2: v_2(X,Y): -b(X,Y).$$

Then D_Q contains the tuples $\{a(x, z_1), a(z_1, z_2), b(z_2, y)\}$ and $\mathcal{V}(D_Q)$ contains the tuples $\{v_1(x, z_2), v_2(z_2, y)\}$. And thus, R_c is the following:

$$R_c: q(X,Y): -v_1(X,Z_2), v_2(Z_2,Y).$$

For convenience of reference, we retain in R_c the names of the variables used in Q. Observe that all variables of R_c are also variables of Q but not necessarily vice versa.

PROPOSITION 4.1. Let Q and \mathcal{V} be conjunctive query and views and R_c be the canonical rewriting. Then the following hold: a) Query Q is contained in the expansion R_c^{exp} of R_c . b) If there is an equivalent rewriting of Q using \mathcal{V} then the canonical rewriting R_c is such an equivalent rewriting.

Proof. a) By construction of R_c there is a containment mapping from its expansion R_c^{exp} to Q.

b)Suppose there is an equivalent rewriting R of Q using \mathcal{V} . Then the expansion R^{exp} of R is equivalent to Q. Hence there is a containment mapping from R^{exp} to Q, and therefore, there is a homomorphism from R^{exp} to D_Q (the canonical database of Q). Thus if a view atom v(t) is in the subgoals of R then there is a homomorphism from the expansion of v(t) to D_Q . This establishes that all subgoals in R must be view atoms that result from view tuples of $\mathcal{V}(D_Q)$. But R_c contains all view tuples in $\mathcal{V}(D_Q)$. Thus, any equivalent rewriting R contains a subset of the subgoals of R_c , and hence R contains R_c and thus Q contains R_c^{exp} . \dashv

5 Query Answering in PTIME

In this section we prove that in certain special cases, if views determine the query then there is an equivalent rewriting, hence, computing the answers to the views can be done in polynomial time.

THEOREM 5.1. Given are a query Q and a set of views V as in one of the cases below:

- 1. All views with no nondistinguished variables.
- 2. Binary base predicates, chain views and query.
- 3. Binary base predicates, query contains only one variable single binary view with only one non-distinguished variable.

Suppose V determines Q. Then there is an equivalent rewriting of Q using V.

Proof. For each special case we prove that the canonical rewriting R_c is an equivalent rewriting.

We will present here only the proof of the first case. Since there are no nondistinguished variables in view definitions R_c^{exp} contains exactly the variables of R_c . By construction, there is a one-to-one mapping from the variables of R_c to the variables of Q which can be extended to a containment mapping μ from R_c^{exp} to Q. Moreover, because of Proposition 2.1, μ uses as targets all subgoals of Q. Since the variables of R_c^{exp} are exactly the variables on R_c , μ is one-to-one and onto, hence μ^{-1} is a containment mapping from Q to R_c^{exp} . \dashv

6 Determinacy and query equivalence

The problem that we investigate in this paper relates determinacy to query rewriting. Since the problem for the CQ case remains open, we address in this section the question whether a simpler (and probably easier to resolve) variant of the problem may relate determinacy to query equivalence. First we ask: If Q_1 is contained in Q_2 and Q_2 determines Q_1 , then are Q_1 and Q_2 equivalent? The following simple example shows that this statement does not hold: Let $Q_1:q_1(X,X):-a(X,X)$ and $Q_2:q_2(X,Y):-a(X,Y)$. Obviously Q_1 is contained in Q_2 . Also Q_2 determines Q_1 because there is an equivalent rewriting of Q_1 using Q_2 , it is $R:q(X,X):-q_2(X,X)$. But Q_1 and Q_2 are not equivalent.

We add some stronger conditions: Suppose in addition that there is a containment mapping that uses as targets all subgoals of Q_1 and this containment mapping maps the variables in the head one-to-one. Still the following counterexample shows that we can not conclude that Q_1 and Q_2 are equivalent.

EXAMPLE 6.1. In this example we have two queries: $Q_1: q_1(X,Y,Z,W,A,B): -r(Y,X), s(Y,X), r(Z,W), s(Z,Z_1), s(Z_1,Z_1), s(Z_1,W), s(A,A_1), s(A_1,A_1), s(A_1,B).$ and

 $\begin{array}{l} Q_2:\ q_2(X,Y,Z,W,A,B):-r(Y,X),s(Y,X),r(Z,W),\\ s(Z,Z_1),s(Z_1,Z_2),s(Z_2,W),s(A,A_1),s(A_1,A_1),s(A_1,B).\\ Clearly\ Q_1\ is\ contained\ in\ Q_2.\ Also\ Q_2\ determines\ Q_1\\ because\ there\ is\ an\ equivalent\ rewriting\ of\ Q_1\ using\ Q_2:\\ R:q_1'(X,Y,Z,W,A,B):-q_2(X,Y,Z,W,A,B), \end{array}$

 $q_2(X_1, Y_1, Z_1, W_1, Z, W).$

Moreover there is a homomorphism from Q_2 to Q_1 that uses all subgoals of Q_1 and is one-to-one on the head variables. But Q_1 and Q_2 are not equivalent.

Finally, in order to be convinced that R is a rewriting, let us consider the expansion $R^{exp}: q_1'(X,Y,Z,W,A,B): -r(Y,X), s(Y,X), r(Z,W), s(Z,Z_1), s(Z_1,Z_2), s(Z_2,W), s(A,A_1), s(A_1,A_1), s(A_1,B), r(Y_1,X_1), s(Y_1,X_1), r(Z_1,W_1), s(Z_1,Z_1'), s(Z_1',Z_2'), s(Z_2',W_1) s(Z,A_1'), s(A_1',A_1'), s(A_1',W).$

Then homomorphism μ_1 is a containment mapping from R^{exp} to Q_1 and homomorphism μ_2 is a containment mapping from Q_1 to R^{exp} :

 $\begin{array}{l} \mu_1 \colon \{X \to X, Y \to Y, Z \to Z, W \to W, A \to A, B \to B, Z_1' \to Z_1, Z_2' \to Z_1, A_1' \to A_1, A_1'' \to Z_1, X_1 \to X, Y_1 \to Y, Z_1 \to Z, W_1 \to W, Z_1'' \to Z_1, Z_2'' \to Z_1\} \\ \mu_2 \colon \{X \to X, Y \to Y, Z \to Z, W \to W, A \to A, B \to B, A_1 \to A_1', Z_1 \to A_1''\} \end{array}$

Finally we add another condition which we denote by $Q_2(D_1) \subseteq_s Q_2(D_2)$, where D_1, D_2 is the canonical databases of Q_1, Q_2 respectively.

We need first explain the notation $Q(D_1) \subseteq_s Q(D_2)$ which in general expresses some structural property of databases D_1 and D_2 with repsect to Q and this

property is invariant under renaming. We say that $Q(D_1) \subseteq_s Q(D_2)$ holds if there is a renaming of the constants in D_1, D_2 such that $Q(D_1) \subseteq Q(D_2)$. For an example, say we have query Q: q(X,Y): -r(X,Y) and three database instances $D_1 = \{r(1,2), r(2,3)\}, D_2 = \{r(a,b), r(b,c)\}$ and $D_3 = \{r(a,b), r(a,c)\}$. Then it holds that $Q(D_1) \subseteq_s Q_1(D_2)$ and $Q(D_1) \subseteq_s Q(D_2)$ because there is a renaming of D_2 (actually here D_1, D_2 are isomorphic) such that $Q(D_1) \subseteq Q_1(D_2)$ and $Q(D_1) \subseteq Q(D_2)$. But the following does not hold: $Q(D_3) \subseteq_s Q(D_2)$.

We may also allow some constants in D_1, D_2 that are special as concerns renaming. Although we need incorporate these constants in the notation, we will keep (slightly abusively) the same notation here since we always mean the same constants. Thus let us return to queries Q_1, Q_2 and their canonical databases D_1, D_2 respectively. Then by $Q_2(D_1) \subseteq_s Q_2(D_2)$ we mean in addition that (i) the frozen variables in the head of the queries are identical component-wise, i.e., if in the head of Q_1 we have tuple (X_1, \ldots, X_m) then in the head of Q_2 we also have same tuple (X_1, \ldots, X_m) and in both D_1, D_2 these variables freeze to constants x_1, \ldots, x_m and (ii) if we need to rename, then we are not allowed to rename the constants x_1, \ldots, x_m .

We introduce a new problem which relates determinacy to query equivalence:

Determinacy and query equivalence: Let Q_1 , Q_2 be conjunctive queries. Suppose Q_2 determines Q_1 , and Q_1 is contained in Q_2 . Suppose also that the following hold: a) there is a containment mapping from Q_2 to Q_1 which (i) uses as targets all subgoals of Q_1 and (ii) maps the variables in the head one-to-one, and b) $Q_2(D_1) \subseteq_s Q_2(D_2)$, where D_1, D_2 are the canonical databases of Q_1, Q_2 respectively. Then are Q_1 and Q_2 equivalent?

Theorem 6.1 states that if CQ is complete for CQ-to-CQ rewritings then the answer to the above question is "yes".

Theorem 6.1. For the following two statement it holds: Statement (A) implies statement (B).

A) Let Q and V be conjunctive query and views. Suppose V determines Q. Then there is an equivalent rewriting of Q using V.

B) Let Q_1 , Q_2 be conjunctive queries. Suppose Q_2 determines Q_1 , and Q_1 is contained in Q_2 . Suppose also that the following hold: a) there is a containment mapping from Q_2 to Q_1 which (i) uses as targets all subgoals of Q_1 and (ii) maps the variables in the head one-to-one, and b) $Q_2(D_1) \subseteq_s Q_2(D_2)$, where D_1, D_2 are the canonical databases of Q_1 , Q_2 respectively. Then Q_1 and Q_2 are equivalent.

Proof. Suppose statement (A) is true. Since Q_2 determines Q_1 and statement (A) is true, there is an equiv-

alent rewriting of Q_1 using Q_2 . Then the canonical rewriting R_c is such a rewriting (see Proposition 4.1). Hence R_c^{exp} is equivalent to Q_1 . Thus, if we prove that R_c^{exp} is equivalent to Q_2 , then this implies that Q_1 and Q_2 are equivalent. We know that there is a containment mapping from Q_2 to R_c^{exp} . In order to prove that there is a containment mapping from R_c^{exp} to Q_2 , we observe that $Q_2(D_1) \subseteq_s Q_2(D_2)$ implies such a mapping. The reason is that there is a containment mapping from R_c^{exp} to Q_1 and this mapping produces some tuples in $Q_2(D_1)$. Therefore analogous tuples must be produced in $Q_2(D_2)$. Hence there is a containment mapping from R_c^{exp} to Q_2 . \dashv

The determinacy and query equivalence question remains open. The following theorem settles a special case where we have replaced condition (b) with a stronger one.

THEOREM 6.2. Let Q_1 , Q_2 be conjunctive queries. Suppose Q_2 determines Q_1 , and Q_1 is contained in Q_2 . Suppose also that the following hold: a) there is a containment mapping that uses as targets all subgoals of Q_1 and this containment mapping maps the variables in the head one-to-one, and b) $Q_2(D_1)$ contains exactly one tuple, where D_1 is the canonical databases of Q_1 . Then Q_1 and Q_2 are equivalent.

Proof. (Sketch) Intuitively the first condition in the statement of the theorem says that Q_1 is a homomorphic image of Q_2 , i.e., formed from Q_2 by identifying variables. Moreover it also says that the distinguished variables are not to be identified, so Q_1 is Q_2 with (perhaps) nondistinguished variables identified. Suppose towards contradiction that Q_2 and Q_1 are not equivalent. Then there is a query Q'_1 such that $Q_1 \sqsubseteq Q'_1 \sqsubseteq Q_2$ and Q'_1 differs from Q_1 only in that Q_1 results from Q'_1 by identifying only two variables (not both distinguished). The following lemma states formally this observation.

LEMMA 6.1. Suppose Q_1 is contained in Q_2 but they are not equivalent. Then there is a query Q'_1 with the properties: a) Q'_1 is contained in Q_2 b) Q_1 is properly contained in Q'_1 and c) the containment mapping h from Q'_1 to Q_1 is identity for all variables of Q'_1 except that $h(X_1) = h(X_2) = X_1$.

Proof. Observe that we conveniently keep the names of the variables in Q_1 and Q'_1 (except X_2 which appears only in Q'_1).

Let h_1 be the homomorphism from the subgoals of Q_2 to the subgoals of Q_1 . Based on h_1 we construct homomorphism h which defines a homomorphic image of Q_2 and has the properties as in the statement of the lemma. Since Q_1 and Q_2 are not equivalent, there are variables X_1, X_2 of Q_2 such that $h_1(X_1) = h_1(X_2)$.

Then h is the following: It is the same as h_1 except that for h we have $h(X_1) \neq h(X_2)$. Hence in Q_1' we have all variable names as in Q_1 and an additional variable X_2 . It is easy to see that Q_1' properly contains Q_1 and is contained in Q_2 . \dashv

Let Q_1' be a query with the properties of the lemma above. Consider the canonical database D_1' of Q_1' and compute $Q_2(D_1')$. We claim that $Q_2(D_1')$ contains at most two tuples. Because: $Q_2(D_1)$ (which contains only one tuple) is a homomorphic image of $Q_2(D_1')$ and thus (because Q_1' has the property in Lemma 6.1 wrto Q_1 , i.e, the homomorphism h which maps Q_1' to Q_1 is the identity except what concerns the variables X_1 and X_2) there may be only one additional tuple in $Q_2(D_1')$, the one that contains X_2 .

Thus we have two cases: a) $Q_2(D_1')$ contains one tuple. b) $Q_2(D_1')$ contains two tuples. In the first case, $Q_2(D_1') = Q_2(D_1)$, hence $Q_1(D_1') = Q_1(D_1)$ which is false, hence a contradiction. In the second case, we construct database $D_1'': D_1''$ is D_1 with additional facts the frozen subgoals that contain X_2 in Q_1' - observe that D_1' is a subset of D_1'' . We observe that $Q_2(D_1'')$ contains at most two tuples for the same reason for which $Q_2(D_1')$ contains at most two tuples. Hence $Q_2(D_1'') = Q_2(D_1')$ and consequently $Q_1(D_1'') = Q_1(D_1')$ a contradiction. \dashv

Theorem 6.2 covers interesting special cases that include: a) queries do not contain self-joins and b) query Q_1 contains a single variable.

7 Principal view set reduction

In this section we first define the concept of principal view set for query Q. Informally a view set \mathcal{V} is principal for Q if in $\mathcal{V}(D_Q)$ there exists one view V_p which we call principal view for Q for which it holds: if there is an equivalent rewriting of Q using \mathcal{V} then a projection of the principal view is such a rewriting. In Theorem 7.1 we reduce the general problem to the special case where the view set is principal.

Let D_p^{exp} be the canonical database of the expansion V_p^{exp} of the principal view V_p . We use the notation $V_p(D_Q) \subseteq_s V_p(D_p^{exp})$ where again we assume that a set of frozen variables are shared between D_Q and D_p^{exp} and are not allowed to be renamed. This is the set of variables in the head of V_p which includes the set of variables in the head of Q and is a subset of the set of variables in Q.

DEFINITION 7.1. (principal view set) Let Q and V be CQ query and views.

• A view $V_p \in \mathcal{V}$ is called principal view for Q if the following hold: a) There is a homomorphism from the definition of V_p to Q which uses all subgoals of Q as targets and is one-to-one for the

distinguished variables of V_p . b) Let t be the tuple of frozen distinguished variables in D_p^{exp} . Then all tuples in $V_p(D_Q)$ use only constants from t and c) $V_p(D_Q) \subseteq_s V_p(D_p^{exp})$.

• A view set is called principal view set for Q if it contains a principal view V_p .

EXAMPLE 7.1. We use the queries Q_1, Q_2 defined in Example 6.1. Thus let $Q = Q_1$ and let the view set contain a single view $V = Q_2$. Then conditions (a) and (b) in Definition 7.1 are true but condition (c) is not.

In order to show that $V(D_Q) \subseteq_s V(D^{exp})$ does not hold let us consider canonical databases, D_Q , of query Q and D^{exp} , of the expansion of view V. It is important however to name constants in D^{exp} according to the targets in Q of the homomorphism claimed in part (a) in Definition 7.1. Thus these databases are:

 $D_Q = \{r(y,x), s(y,x), r(z,w), s(z,z_1), s(z_1,z_1), s(z_1,w), s(a,a_1), s(a_1,a_1), s(a_1,b)\}$

$$\begin{split} D^{exp} &= \{r(y,x), s(y,x), r(z,w), s(z,z_1'), s(z_1',z_2'), s(z_2',w), \\ s(a,a_1), s(a_1,a_1), s(a_1,b)\} \end{split}$$

We compute $V(D_Q) = \{(x, y, z, w, a, b), (x, y, z, w, z, w)\}$ and $V(D^{exp}) = \{(x, y, z, w, a, b)\}$. Hence $V(D_Q) \subseteq_s$ $V(D^{exp})$ does not hold, therefore V is not a principal view for Q and view set $\{V\}$ is not a principal view set for Q.

Given arbitrary query Q and views \mathcal{V} we can construct a principal view from the canonical rewriting R_c . We call this view canonical view and denote by V_c . We construct view V_c to have as subgoals exactly all subgoals of the expansion of R_c and in the head of V_c we have exactly all variables of R_c .

EXAMPLE 7.2. From Example 4.1 we have that the canonical rewriting for $\{V_1, V_2\}$ and Q is

$$R_c: q(X,Y): -v_1(X,Z_2), v_2(Z_2,Y).$$

and hence the canonical view is

$$V_c: v_c(X, Y, Z_2): -a(X, Z_1), a(Z_1, Z_2), b(Z_2, Y).$$

PROPOSITION 7.1. Let Q and V be query and views defined by conjunctive queries. Then the canonical view V_c is a principal view for Q.

Proof. (sketch) Clearly $V_c(D_Q)$ contains at least one tuple t by construction of V_c . Moreover t is obtained by a homomorphism which maps one-to-one the distinguished variables of V_c and uses all subgoals of Q according to Proposition 2.1. This proves part (a) of Definition 7.1.

Now observe that any homomorphism from the definition of V_c to D_Q creates view tuples in $\mathcal{V}(D_Q)$. Suppose there is an homomorphism from the definition of V_c to D_Q which does not use constants in t. Then this

homomorphism creates view tuples not in R_c which is a contradiction because R_c contains as subgoals all view tuples in $\mathcal{V}(D_Q)$. This proves part (b) of the definition. For the same reason, the following leads to contradiction and hence proves part (c) of the definition: If there is a tuple in $V_p(D_Q)$ and not in $V_p(D_p^{exp})$ then this yields that a view tuple in $\mathcal{V}(D_Q)$ does not appear in the subgoals of R_c . \dashv

The following theorem reduces the general problem to the problem where we have a principal view set.

THEOREM 7.1. Let Q and V be query and views. Then there is a principal view set V' such that the following hold:

- 1. If V determines Q then V' determines Q.
- 2. If there is an equivalent rewriting of Q using \mathcal{V}' then there is an equivalent rewriting of Q using \mathcal{V} .

Proof. View set \mathcal{V}' is the union of \mathcal{V} and the set that contains only the canonical view. We proved in Proposition 7.1 that the canonical view is a principal view.

The following proposition is an immediate consequence of Proposition 4.1.

PROPOSITION 7.2. Let Q and V be query and views such that V is a principal view set for Q. If there is an equivalent rewriting of Q using V, then there is an equivalent rewriting which is a projection of the principal view of V.

Proposition 7.2 states that in the case of principal view set, if there is an equivalent rewriting then a projection of the principal view is an equivalent rewriting. Note that in Section 6 we essentially discussed a case where the principal view does not need a projection to produce a rewriting.

8 Other Reductions

In this section we prove the following theorem and provide some formal considerations about connectivity too. By CQ_{bin} we mean the language of CQs where the base predicates are binary. By $CQ_{Bool,bin}$ we mean the language of CQ_{bin} where the query is boolean.

THEOREM 8.1. If the language of CQ is complete for CQ_{bin} -to- $CQ_{Bool,bin}$ rewritings then it is complete for CQ-to-CQ rewritings.

8.1 Binary base predicates Here we prove:

THEOREM 8.2. If the language of CQ is complete for CQ_{bin} -to- CQ_{bin} rewritings then it is complete for CQ-to-CQ rewritings.

The above theorem is an immediate consequence of the following theorem.

THEOREM 8.3. Let Q and V be query and views. Then there is a view set V' and a query Q' defined on binary base predicates such that the following hold:

- 1. If V determines Q then V' determines Q'.
- 2. If there is an equivalent rewriting of Q' using V' then there is an equivalent rewriting of Q using V.

Proof. (Sketch) We construct query Q' and views \mathcal{V}' as follows: We introduce for each base predicate p_i of arity r_i a collection of $r_i(r_i-1)/2$ distinct binary base predicates $a^i_{j,j'}, j < j' = 1, \ldots, r$. From query Q (view V_j respectively) we construct query Q' (view V_j' respectively) as follows. We replace each occurrence of predicate atom $p_i(X_1, \ldots, X_r)$ by $r_i(r_i-1)/2$ binary predicates atoms which in particular are: $a^i_{j,j'}(X_j, X_{j'}), j < j' = 1, \ldots, r$. Intuitively each base predicate is replaced by a clique but the edges of the clique have different predicate names in order to retain the information about the positions of the variables when they are used as arguments in the non-binary predicates.

Proof of part 1. Let D_1', D_2' be databases over the binary predicates such as $\mathcal{V}'(D_1') = \mathcal{V}'(D_2')$. We construct from D_1', D_2' database instances D_1, D_2 over the predicates used in \mathcal{V} . For each homomorphic image of a clique in D_i' we add in D_i a tuple accordingly in a way that corresponds to the construction above. The homomorphic mappings of the views \mathcal{V}' on D_i' carry over to homomorphic mappings of the views \mathcal{V} on D_i and vice versa. Hence $\mathcal{V}'(D_i') = \mathcal{V}(D_i)$ and $Q'(D_i') = Q(D_i)$. Therefore $\mathcal{V}(D_1) = \mathcal{V}(D_2)$. This yields that $Q(D_1) = Q(D_2)$.

Proof of part 2. If there is an equivalent rewriting of Q' using \mathcal{V}' then we claim that the same with the primed view atoms replaced by unprimed view atoms is an equivalent rewriting of Q using \mathcal{V} . The containment mappings that are used in the former case carry over to the latter because the distinct binary base predicates introduced take care of the positions of the variables in the non-binary base predicates of the latter case. \dashv

8.2 Boolean Queries Here we prove Theorem 8.1 which is an immediate consequence of the following:

THEOREM 8.4. Let Q and V be query and views over binary predicates. Then there is a view set V' and a boolean query Q' over binary predicates such that the following hold:

- 1. If V determines Q then V' determines Q'.
- 2. If there is an equivalent rewriting of Q' using V' then there is an equivalent rewriting of Q using V.

Proof. (Sketch) Given query Q of arity r and views \mathcal{V} we construct query Q' and views \mathcal{V}' as follows. First introduce r new predicates for new base relations let them be a_1, \ldots, a_r . Query Q' is a Boolean query with all subgoals in Q and additional subgoals one for each

argument in the head. More specifically, if variable X is in the head in position i then we add $a_i(X, Z)$ where Z is also a new variable used (different from all other variables used also in Q). The views \mathcal{V}' include all views in \mathcal{V} and some new views. We add new views one for each a_i defined by $v_i(t) : -a_i(t)$. The rest of the proof is not hard. \dashv

8.3 Connectivity The following example shows the intuition for the result in this section.

EXAMPLE 8.1. Suppose we have query:

$$Q: Q(X): -r(Y, X), s(Y, X), s(Z, Z_1), s(Z_1, Z).$$

and views V:

$$V_1: v_1(X,Y): -r(Y,X).$$

 $V_2: v_2(X,Y): -s(Y,X), s(Z,Z_1), s(Z_1,Z).$

Clearly the rewriting $R_1: Q(X): -v_1(X,Y), v_2(X,Y)$. is an equivalent rewriting of Q using \mathcal{V} . Note however, that the two last subgoals in the query are (what we call in the definition below semi-covered) such that either they are covered by a single view among the views in the particular view set or not at all. The reason is that these two subgoals do not contain any variables in the view tuples of $\mathcal{V}(D_Q)$ (D_Q is the canonical database of Q) hence it is not possible to "glue together" several views to "cover" these two subgoals. In that case, we might be able to simplify the problem by reducing it to the following query Q' and views \mathcal{V} :

$$Q': Q'(X): -r(Y, X), s(Y, X).$$

and views V:

$$V_1': v_1'(X,Y): -r(Y,X).$$

$$V_2': v_2'(X,Y): -s(Y,X).$$

Then the same rewriting provides an equivalent rewriting of Q' using \mathcal{V}' . We make this formal in this subsection.

DEFINITION 8.1. (Connectivity graph of query) Let Q be a conjunctive query. The nodes of the connectivity graph of Q are all the subgoals of Q and there is an (undirected) edge between two nodes if they share a variable or a constant.

A connected component of a graph is a maximal subset of its nodes such that for every pair of nodes in the subset there is a path in the graph that connects them. A connected component of a query is a subset of subgoals which define a connected component in the connectivity graph. A graph with only one connected component is called connected. A query is connected if its connectivity graph is connected.

DEFINITION 8.2. (semi-covered component) Let Q and V be CQ query and views. Let G be a connected component of query Q. Suppose that any variable in G is such that there is no tuple in $V(D_Q)$ (D_Q is the canonical database of Q) that contains it. Then we say that G is a semi-covered component of Q wrto V.

We prove the following which is the main result of this subsection.

THEOREM 8.5. If the language of CQ is complete for CQ-to-CQ rewritings where the query does not contain any semi-covered components wrto the views then it is complete for CQ-to-CQ rewritings.

THEOREM 8.6. Let Q and V be query and views. Then there is a view set V' and a query Q' such that Q' has no semi-covered components wrto V' and the following hold:

- 1. If V determines Q then V' determines Q'.
- 2. If there is an equivalent rewriting of Q' using V' then there is an equivalent rewriting of Q using V.

9 Conclusion

We have investigated the problem whether CQ is complete for CQ-to-CQ rewritings. We have presented a number of special cases for which CQ is complete. On the other end, we have reduced the general problem to more restricted variants. A new problem is introduced in Section 6 that relates determinacy to query equivalence and seems "easier" to resolve than the original problem. However this also remains open, since here we have solved only a (pretty broad) special case of it. Reducing the original problem to the determinacy and query equivalence problem is another open question. Further we provided a reduction in Section 7 which shows that the problem can be reduced to the case where a projection of a special view provides an equivalent rewriting if there exists one.

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