

# Open-World Finite Query Answering with Number Restrictions

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# Open-world query answering (QA)

- Open-world query answering:
  - Relational instance  $I$  (ground facts), correct but incomplete
  - Boolean conjunctive query  $q$
  - Consider all possible completions  $J \supseteq I$
  - Is  $q$  certain, i.e., holds on all completions? If yes,  $I \models_{\text{unr}} q$

# Constraints

- Impose **constraints** on the possible completions
  - **Inclusion dependencies**: some facts imply more facts:  
 $\forall x d \text{ Employee}(x, d) \Rightarrow \exists y \text{ Advises}(x, y, d)$   
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  - **Functional dependencies** (FDs): uniqueness constraints:  
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- Consider all  $J \supseteq I$  that **satisfy the constraints**
- Is  $q$  **certain** on all such completions? If yes,  $I, \Sigma \models_{\text{unr}} q$

# Finite vs infinite

**Instance:** List of adviser–advisee pairs:  $\text{Advises}(a, b), \dots$

**UID:** Each advisee advises someone  
 $\text{Advises}[2] \subseteq \text{Advises}[1]$

**FD:** Each advisee has only one adviser  
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- $q$  is **not certain**:  
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→  $\Sigma$  **finitely controllable:**  $\forall I \forall q, I, \Sigma \models_{\text{fin}} q$  iff  $I, \Sigma \models_{\text{unr}} q$

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1 Introduction

**2 Context and result**

3 Proof ideas

4 Conclusion

## Existing results

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- **Infinite** open-world query answering is **decidable** for **UIDs** and FDs [Calì et al., 2012] but **not finitely controllable** (see above; [Rosati, 2006])
- (Finite) open-world query answering is **decidable** for IDs and FDs with relations of **arity  $\leq 2$**  [Pratt-Hartmann, 2009, Ibáñez-García et al., 2014]

## Problem and main result

- Study **finite QA** for **UIDs** and **FDs** on **arbitrary signatures**
- Is it **decidable**? What is the **complexity**?



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## Theorem

*Finite open-world query answering for UIDs and FDs has **PTIME** data complexity and **NP-complete** combined complexity.*

# Main idea

- Find which UIDs and FDs are implied over **finite** instances
  - This is **PTIME** [Cosmadakis et al., 1990]
  - It **differs** from unrestricted implication
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## Theorem

For any *instance*  $I$ , *conjunctive query*  $q$ , *UIDs and FDs*  $\Sigma$ ,  
letting  $\Sigma^*$  be the *finite closure* of  $\Sigma$ ,  
we have  $I, \Sigma \models_{\text{fin}} q$  iff  $I, \Sigma^* \models_{\text{unr}} q$ .

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- Assume that the UIDs and FDs  $\Sigma$  are **finitely closed**
  - Assume that an **infinite completion**  $J$  satisfies  $\Sigma$  but not  $q$
- Construct a **finite completion**  $J'$  satisfying  $\Sigma$  but not  $q$ :
- **Start** with  $I$
  - Follow  $J$  and **add facts** to satisfy the **UIDs** of  $\Sigma$ ...
  - ... using **finitely many elements** (reuse them)
  - ... but respecting the **FDs** of  $\Sigma$
  - ... and without making  $q$  **inadvertantly true**



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5. Assume that the query  $q$  is **acyclic**  
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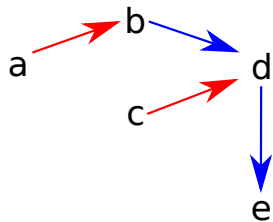
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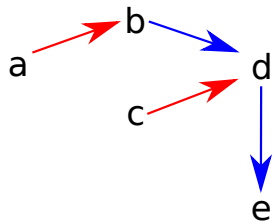
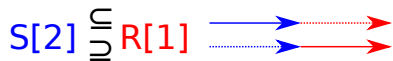
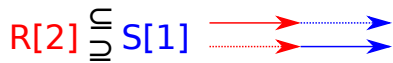
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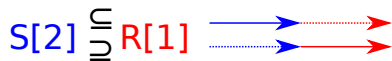
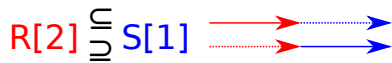
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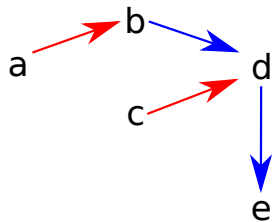
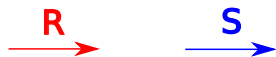
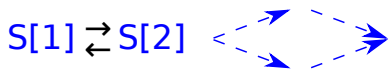
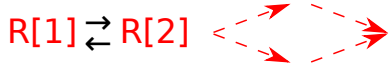


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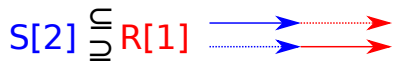
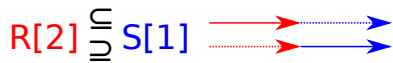
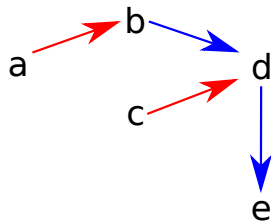
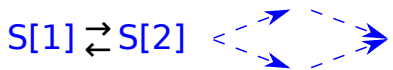
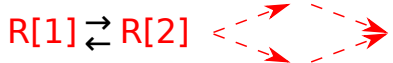
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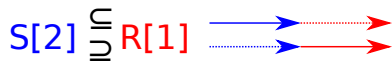
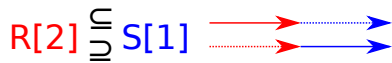


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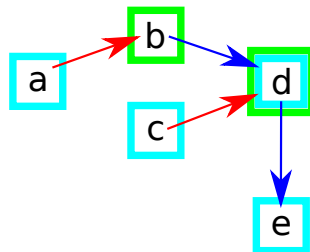
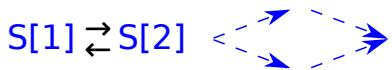
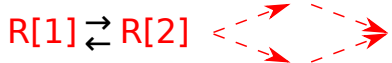
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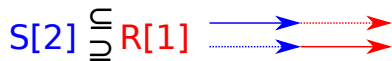
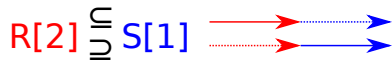


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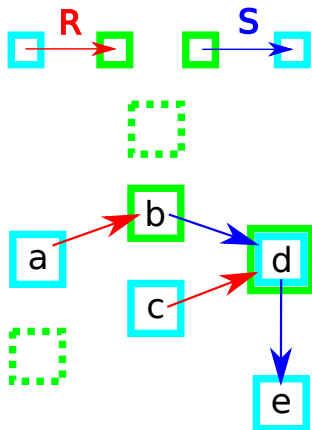
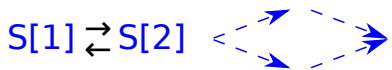
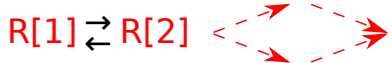


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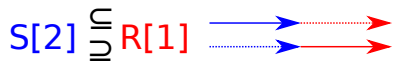


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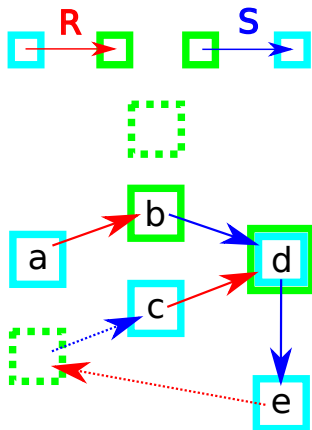
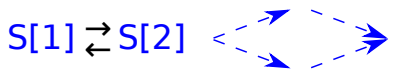
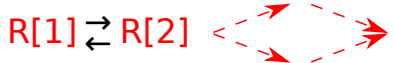


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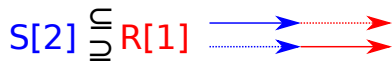
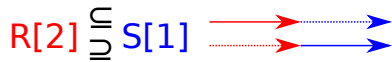


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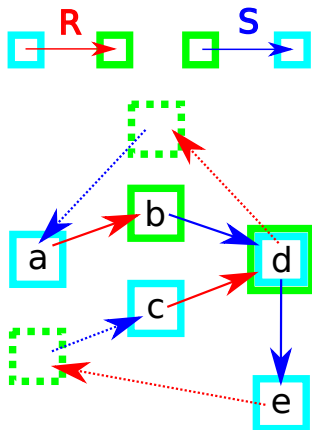
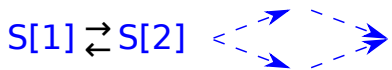
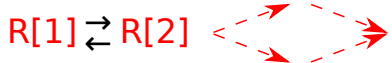


# 0. Satisfying UIDs and UFDs in arity-two

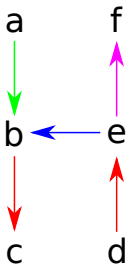
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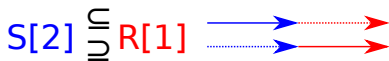
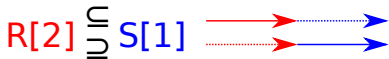
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## 2. Adding acyclic queries

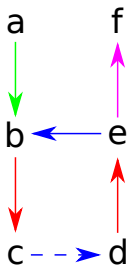


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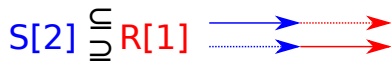


**and UFDs...**

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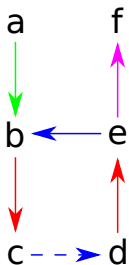
**UIDs:**



**and UFDs...**



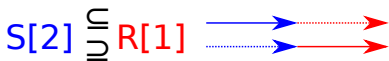
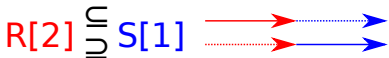
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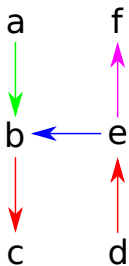


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and UFDs...

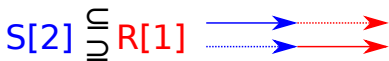
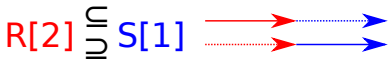
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**query:**

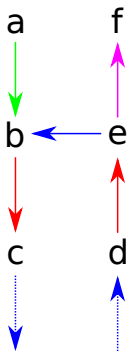


**UIDs:**



**and UFDs...**

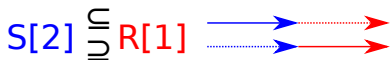
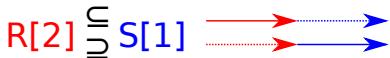
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**query:**

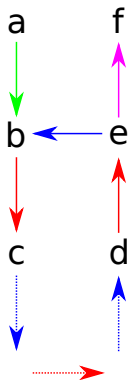


**UIDs:**



**and UFDs...**

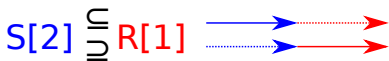
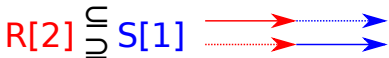
## 2. Adding acyclic queries



**query:**



**UIDs:**



**and UFDs...**

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1 Introduction

2 Context and result

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**4 Conclusion**

# Summary

- **Finite** open-world query answering with:
  - relational instance
  - **arbitrary arity** signature
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  - conjunctive query

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Thanks for your attention!

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*Inf. Comput.*, 207(8).

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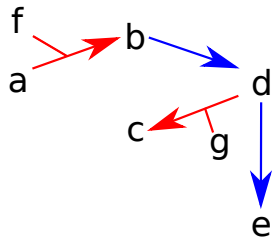
On the decidability and finite controllability of query processing in databases with incomplete information.

In *PODS*.

## 1. Supporting arbitrary arity

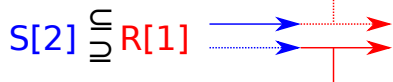
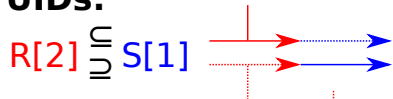


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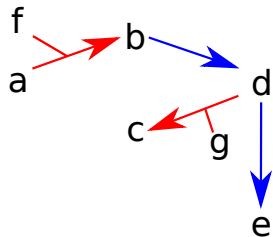
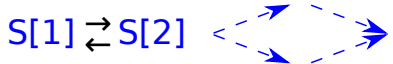
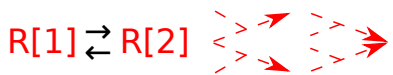


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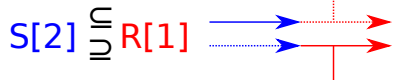
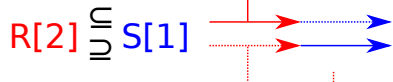


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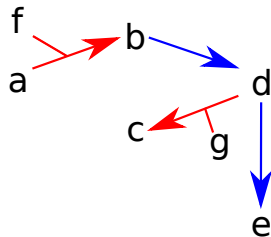
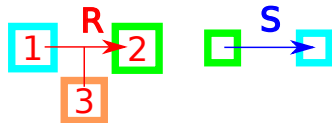
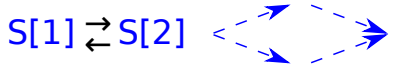
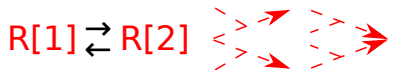


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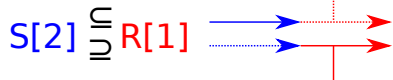
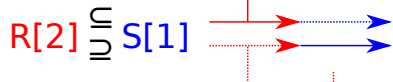
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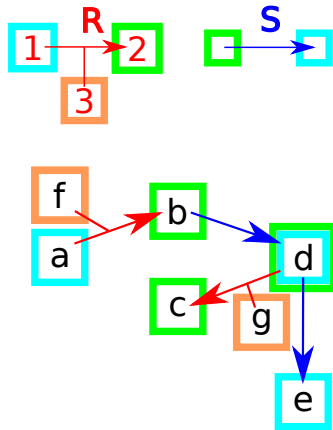
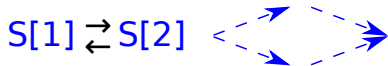


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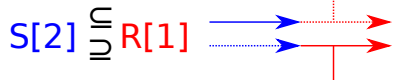
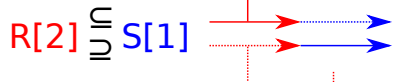


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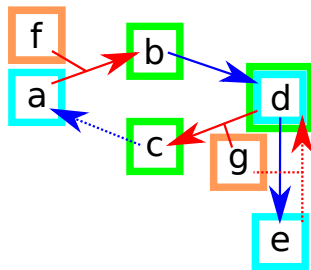
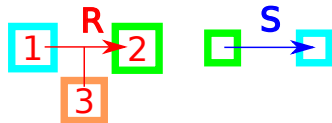
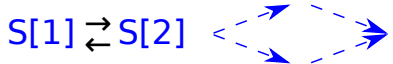
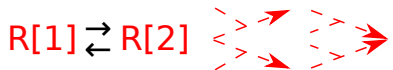


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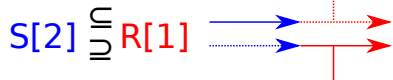
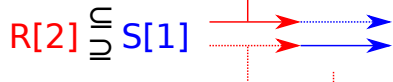


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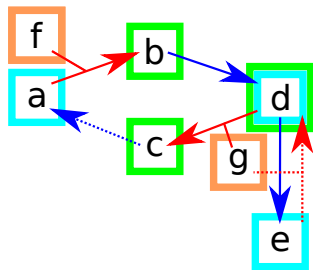
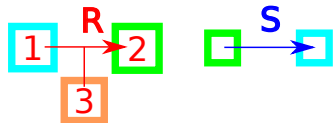
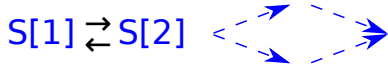


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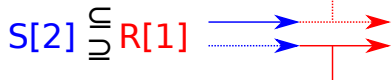
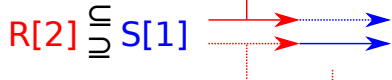
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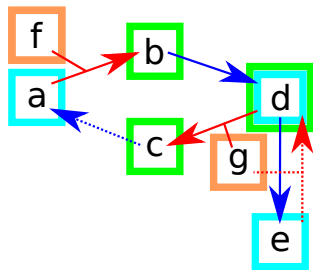
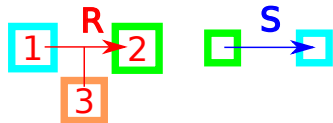
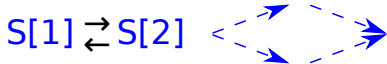
- When no UFDs: **reuse** elements from suitable positions

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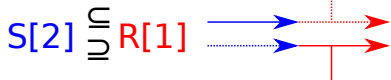
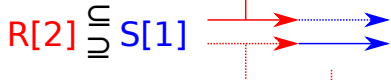
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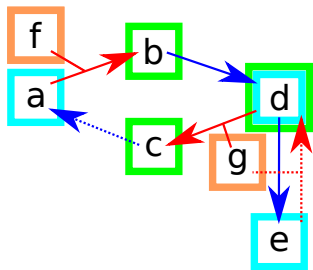
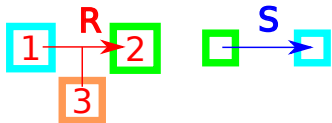
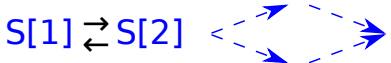
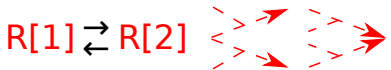
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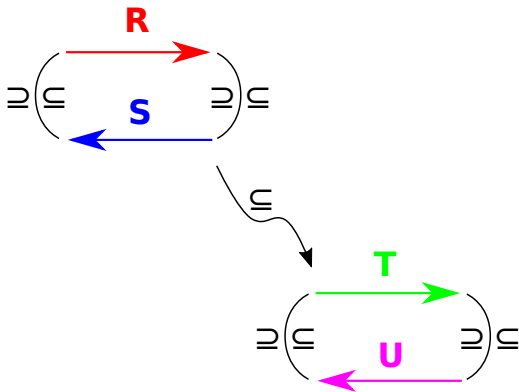


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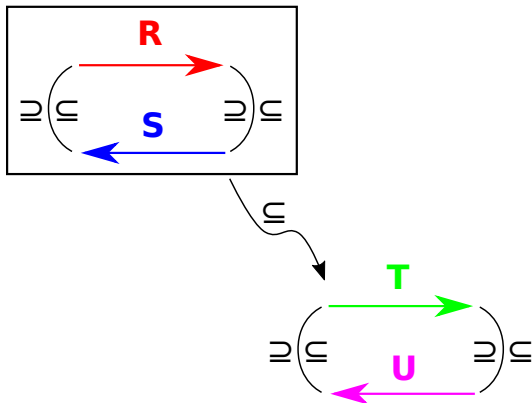


- When no UFDs: **reuse** elements from suitable positions  
 → Must **saturate** initially to make sure such elements exist
- With UFDs: **bijective** maps within  $\leftrightarrow$ -classes

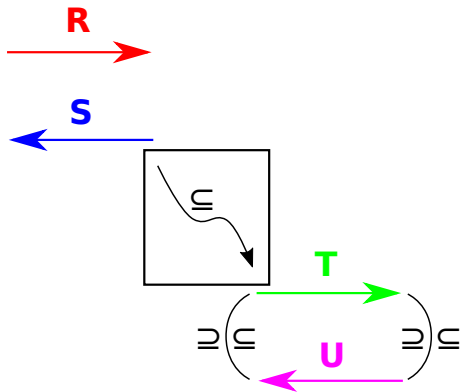
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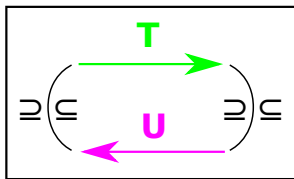
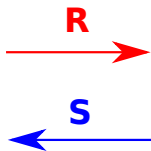


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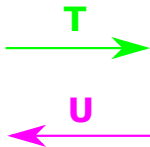
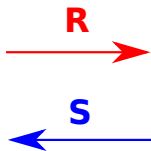




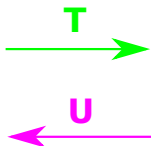
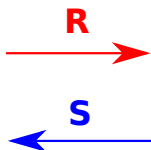
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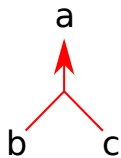


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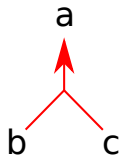


- UIDs can be **decomposed** in **reversible** subsets
- The subsets can be solved **independently**
- Relies on the **finite implication** construction  
[Cosmadakis et al., 1990]

## 4. From UFDs to FDs

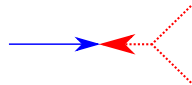


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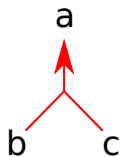


**UID:**

$$S[2] \subseteq R[2]$$

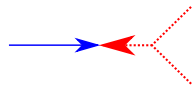


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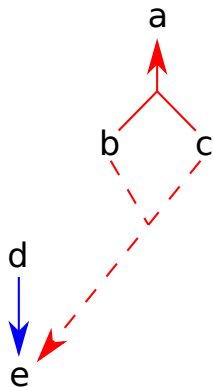


**FD:**

$$R[1,3] \rightarrow R[2]$$

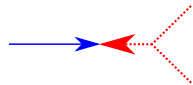


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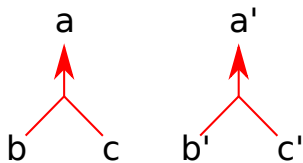


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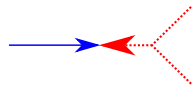


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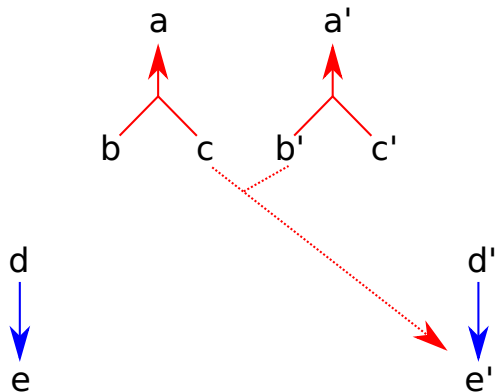
**FD:**

$$R[1,3] \rightarrow R[2]$$



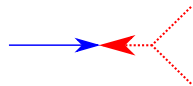


## 4. From UFDs to FDs



**UID:**

$$S[2] \subseteq R[2]$$

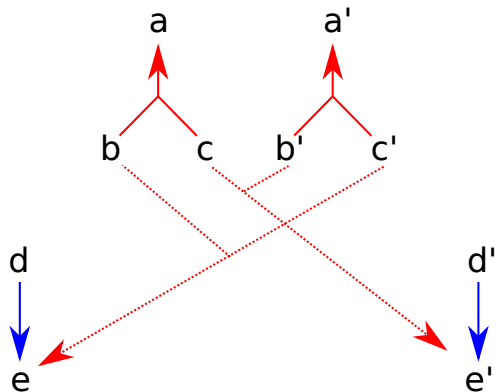


**FD:**

$$R[1,3] \rightarrow R[2]$$

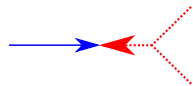


## 4. From UFDs to FDs



**UID:**

$$S[2] \subseteq R[2]$$

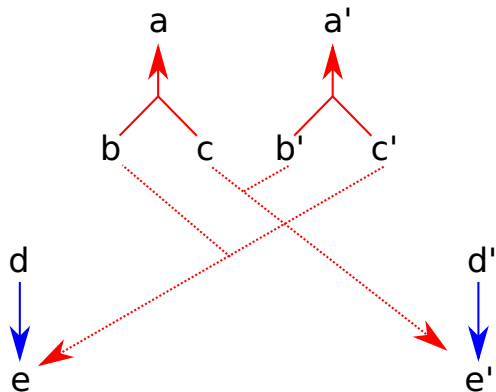


**FD:**

$$R[1,3] \rightarrow R[2]$$



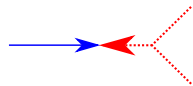
## 4. From UFDs to FDs



- Create initially many **reusable elements**
- Reuse them in **new combinations**

**UID:**

$$S[2] \subseteq R[2]$$

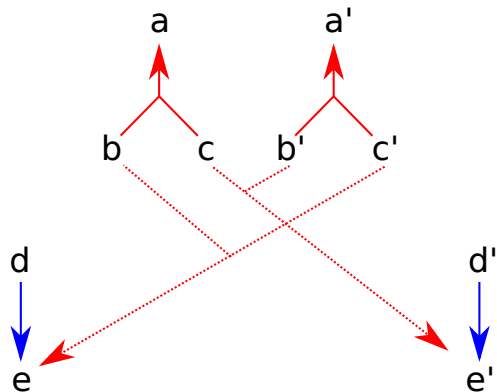


**FD:**

$$R[1,3] \rightarrow R[2]$$



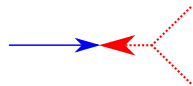
## 4. From UFDs to FDs



- Create initially many **reusable elements**
- Reuse them in **new combinations**
- **Dense interpretations lemma:**  
linearly many elements give **super-linearly** many combinations

**UID:**

$$S[2] \subseteq R[2]$$

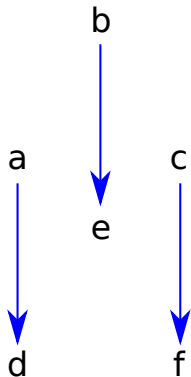


**FD:**

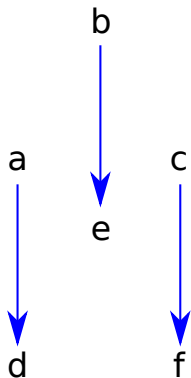
$$R[1,3] \rightarrow R[2]$$



## 5. From acyclic queries to arbitrary queries



## 5. From acyclic queries to arbitrary queries



**UID:**

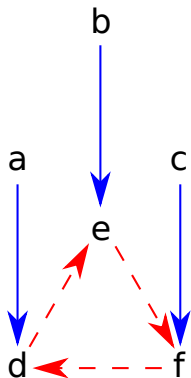
$S[2] \subseteq R[1]$



$S[2] \subseteq R[2]$



## 5. From acyclic queries to arbitrary queries



**UID:**

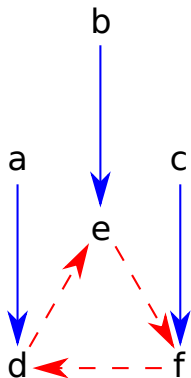
$S[2] \subseteq R[1]$



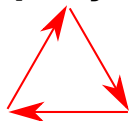
$S[2] \subseteq R[2]$



## 5. From acyclic queries to arbitrary queries



**query:**



**UID:**

$S[2] \subseteq R[1]$

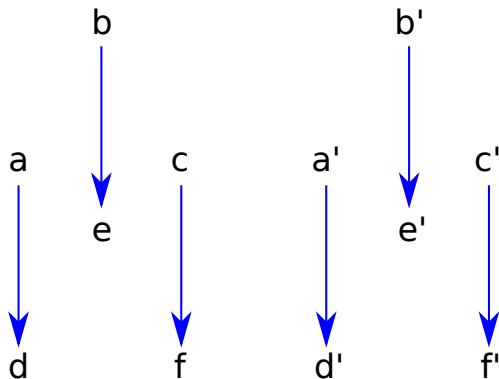


$S[2] \subseteq R[2]$





## 5. From acyclic queries to arbitrary queries



**UID:**

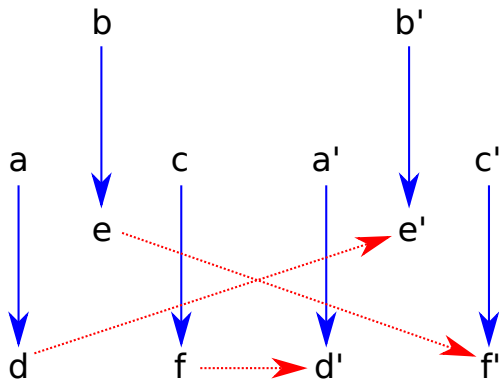
$S[2] \subseteq R[1]$



$S[2] \subseteq R[2]$



## 5. From acyclic queries to arbitrary queries



**UID:**

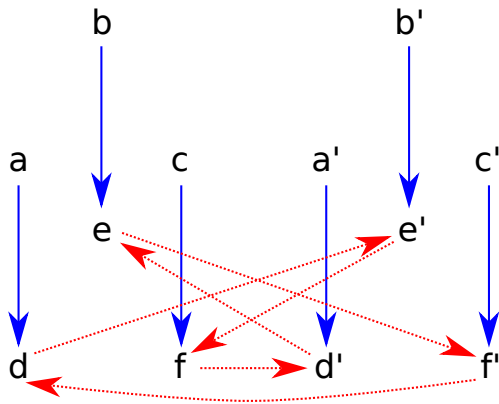
$S[2] \subseteq R[1]$



$S[2] \subseteq R[2]$



## 5. From acyclic queries to arbitrary queries



**UID:**

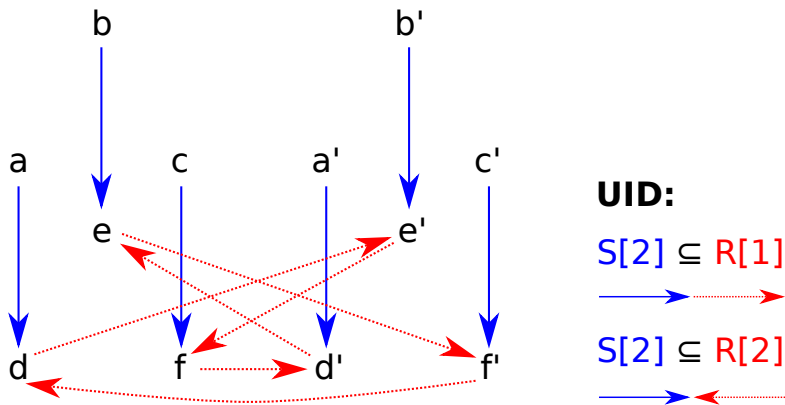
$S[2] \subseteq R[1]$



$S[2] \subseteq R[2]$



## 5. From acyclic queries to arbitrary queries



- Product with a group of **high girth** [Otto, 2002]
- Must be **tweaked** to avoid violating FDs