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# Open-World Finite Query Answering Under Number Restrictions

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- Evaluate query q over instance l, open-world assumption:
  - The instance *I* is correct but incomplete
  - Consider all possible completions J satisfying constraints  $\Sigma$
  - Certain answers to query q among those completions
  - $\Rightarrow$  Formally:  $I, \Sigma \models q$  if  $J \models q$  for all  $J \supseteq I$  s.t.  $J \models \Sigma$



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  - Constraints:
    - TGDs, especially inclusion dependencies (ID)
      - $\Rightarrow$  Unary inclusion dependencies (UID):  $R[A] \subseteq S[B]$
    - Number restrictions, especially functional dependencies (FD)



# Open-world query answering

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- Constraints:
  - TGDs, especially inclusion dependencies (ID)
    - ⇒ Unary inclusion dependencies (UID):  $R[A] \subseteq S[B]$
  - Number restrictions, especially functional dependencies (FD)
- Finite vs unrestricted QA

Instance: List of employees

Constraint 1: Each employee reviews some employee (UID)

Constraint 2: At most one reviewer per employee (FD)

Query: Are all employees reviewed?

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- 2 Existing approaches
  - 3 Result







- Entailment of IDs and FDs is undecidable [Mitchell, 1983]
- Already for binary IDs and unary FDs:  $R[A, B] \subseteq S[C, D], R[A] \rightarrow R[B]$
- ⇒ QA (finite or not) is also undecidable [Calì et al., 2003] (Remark: this proof requires constants in the query)



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- $\Rightarrow$  We can't have everything



- The chase for IDs: universal model
- Intuition: apply all IDs with fresh elements
- FDs are separable from IDs if they do not impact the chase
- Sufficient conditions for separability, e.g., non-conflicting:
  ⇒ exported positions must not be a strict superset of a key
- When separable, we can ignore FDs (just check them on I)



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  ⇒ exported positions must not be a strict superset of a key
- When separable, we can ignore FDs (just check them on *I*)
- $\Rightarrow$  The chase is infinite in general so it doesn't work in the finite
- ⇒ Finite QA undecidable for separable IDs/FDs [Rosati, 2006] (intuition: their finite consequences may not be separable)



- Finite controllability means that finite and infinite QA coincide
- IDs are finitely controllable [Rosati, 2006]
  - $\Rightarrow$  Construction: finite chase (chase with distant reuses)
- Generalizes to the guarded fragment [Barany et al., 2010]
  ⇒ (Guarded means that ∀/∃ must be covered by an atom)
  ⇒ Intuition: query acyclification and cycle blowup
- Generalises to IDs/FDs with foreign keys condition [Rosati, 2006]



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- Generalises to IDs/FDs with foreign keys condition [Rosati, 2006]
- $\Rightarrow$  FDs are not expressible in the guarded fragment.
- $\Rightarrow$  IDs/FDs are **not** finitely controllable!



- Finite and unrestricted QA decidable in arity-two for the two-variable guarded fragment and counting constraints [Pratt-Hartmann, 2009]
  - Intuition: again, encode the acyclic part of the query
  - Satisfiability decidable by reduction to an inequation system
- Explicit construction for DLs [Ibáñez-García et al., 2014]



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- Explicit construction for DLs [Ibáñez-García et al., 2014]
- ⇒ Only for arity-two signatures
- $\Rightarrow$  No clear way to generalize to higher arity

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Introduction

2 Existing approaches





#### 5 Conclusion

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Our setting				

• So:

- Finite QA
- TGDs and EGDs with interaction (not FC)
- High-arity signatures
- $\Rightarrow$  Can we have all three?

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Introduction O	Existing approaches	Result •0000	Proof ideas	Conclusion O
Our setting				

#### • So:

- Finite QA
- TGDs and EGDs with interaction (not FC)
- High-arity signatures
- $\Rightarrow$  Can we have all three?
- $\Rightarrow$  What if we restrict the language to UIDs and FDs?
  - No direct encoding to arity-two (unlike UIDs/UKDs...)
  - UIDs are important IDs in practice
  - UIDs match the DL intuition
  - UIDs are less expressive than BIDs
  - and...

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Finite closure	e for UIDs and F	Ds		

- Implication of UIDs/FDs is decidable and PTIME [Cosmadakis et al., 1990]
- Unrestricted and finite do not coincide

Introduction O	Existing approaches	Result 0●000	Proof ideas	Conclusion O
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- Unrestricted and finite do not coincide
- For unrestricted: implication of FDs and UIDs in isolation
- For finite: add cycle reversal:
  - Consider only unary FDs:  $R[i] \rightarrow S[j]$
  - When  $R[i] \subseteq S[j]$  we have  $|R[i]| \le |S[j]|$
  - When  $R[i] \rightarrow S[j]$  we have  $|R[i]| \ge |S[j]|$
  - Inequality cycles with this encoding



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  - Inequality cycles with this encoding
  - $\Rightarrow$  In the finite, such cycles must be reversed

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Finite closur	e example			



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Finite clo	sure example			



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Introduction O	Existing approaches	Result 00●00	Proof ideas	Conclusion O
Finite closure	e example			



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- $R[2] \subseteq R[1]$
- $R[2] \rightarrow R[1]$
- $\Rightarrow |R[2]| \le |R[1]|$
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  - Add  $R[1] \subseteq R[2]$
  - Add  $R[1] \rightarrow R[2]$
- $\Rightarrow$  No finite model!



# Finite controllability up to closure

- In arity-two, UIDs/UFDs finitely controllable up to finite closure [Rosati, 2008, Ibáñez-García et al., 2014]
- $\Rightarrow$  To perform finite QA on instance *I*, UIDs/UFDs  $\Sigma$ :
  - Compute  $\Sigma^*$  the finite closure of  $\Sigma$
  - Check if I satisfies the UFDs of  $\Sigma^{\ast}$
  - Perform unrestricted QA with I and  $\Sigma^{*}$
  - Easy because UIDs/UFDs are non-conflicting so separable



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- Perform unrestricted QA with I and  $\Sigma^{*}$
- Easy because UIDs/UFDs are non-conflicting so separable
- $\Rightarrow$  Does this also hold with higher-arity relations and FDs?

Introduction O	Existing approaches	Result 0000	Proof ideas	Conclusion O
The result				

#### Theorem

UIDs and FDs, though not finitely controllable, are finitely controllable up to finite closure, on arbitrary arity signatures.

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The result				

#### Theorem

UIDs and FDs, though not finitely controllable, are finitely controllable up to finite closure, on arbitrary arity signatures.

⇒ It suffices to show that for any k, I, and  $\Sigma^*$ , there is a finite completion of I by  $\Sigma^*$  which is universal for queries of size  $\leq k$ 

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Quotienting	the chase			

# $\mathsf{R}[2]\subseteq\mathsf{R}[1]$



#### • Consider *k*-neighborhood equivalence



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



- Consider *k*-neighborhood equivalence
- Quotient the chase by this relation




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- Consider *k*-neighborhood equivalence
- Quotient the chase by this relation
- May violate FDs
- Not universal (cycles) even for  $\leq k$
- Yet universal for  $\leq k$  acyclic queries
- Keep a homomorphism to this quotient

Introduction	Existing approaches	Result	Proof ideas	Conclusion
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Frugal chase	steps			

#### • Follow the chase

# 



#### Follow the chase













- Follow the chase
- Partition positions:
  - Exported position
  - Dangerous positions (determiners for an UFD)
  - Non-dangerous positions (the rest)





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## Blueprint



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## Blueprint

• Infinite functional paths...



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Blueprint

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## Blueprint

• Infinite functional paths...



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Blueprint				

- Infinite functional paths...
- ... but only within a cycle



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O		00000	00●00000	O
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Introduction O	Existing approaches	Result 00000	Proof ideas	Conclusion O
Blueprint				

- Infinite functional paths...
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- Connect it back (match elements)



Introduction O	Existing approaches	Result 00000	Proof ideas	Conclusion O
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Blueprint				

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Introduction	Existing approaches	Result	Proof ideas	Conclusion
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Blueprint				

- Infinite functional paths...
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- Uses cardinality along cycles...



Introduction	Existing approaches	Result	Proof ideas	Conclusion
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Blueprint				

- Infinite functional paths...
- ... but only within a cycle
- Connect it back (match elements)
- More complex if many positions of many relations are involved...
- Uses cardinality along cycles...
- ... but also initial chasing to force "generic neighborhoods"



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Dependency	graph			

#### • Build a DAG on the dependency cycles



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Dependency	graph			

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Dependency	graph			



• Build a DAG on the dependency cycles

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- Build a DAG on the dependency cycles
- We never create fresh elements for a higher dependency in the DAG





- Build a DAG on the dependency cycles
- We never create fresh elements for a higher dependency in the DAG
- Satisfy cycles along a topological sort

Introduction Existing approaches Result 0 0000 00000 Proof ideas

Conclusion O

## Dependency graph



- Build a DAG on the dependency cycles
- We never create fresh elements for a higher dependency in the DAG
- Satisfy cycles along a topological sort
- ⇒ Finite extension that satisfies UIDs/UFDs with a homomorphism to the quotient
| Introduction<br>O | Existing approaches | Result<br>00000 | Proof ideas | Conclusion<br>O |
|-------------------|---------------------|-----------------|-------------|-----------------|
| Higher-arity      | FDs                 |                 |             |                 |

- Ignored so far
- May only be triggered at non-dangerous reuses
- Idea: if non-dangerous but dangerous for higher-arity FD then no unary key





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#### • Idea:

- create many reuse candidates
- combine them in different patterns
- $\Rightarrow$  Lemma: if no UKD then  $O(n^{>1})$  patterns for O(n) elements

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Higher-arity FDs				



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Higher-arity I	=Ds			



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Higher-arity I	FDs			
O(r ele	n) ments			

reuse candidates

R

R

O(n^>1)

patterns















Introduction	Existing approaches	Result	Proof ideas	Conclusion
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Blowing up of	cycles			

- Usually: product with a group of high girth [Otto, 2002]
- Ensures all non-instance cycles are large
- We cannot do it directly as it would violate the FDs

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  - FD violations can only appear on non-dangerous reuses...
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  - ... so cycles on them are self-homomorphic in the quotient



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  - $\bullet \ \ldots$  so cycles on them are self-homomorphic in the quotient



 $\Rightarrow$  Blow up cycles, but not those cycles

Introduction	Existing approaches	Result	Proof ideas	Conclusion
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Blowing up o	cycles via the pr	oduct		

# k-acyclicuniversal

chase/≡<sub>k</sub>







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Summarv				

- UIDs/FDs finitely controllable up to closure
- Main differences with arity-two:
  - Clusters for non-dangerous reuses
  - Combinations for higher-arity FDs
  - More complex reconnexions along cycles
  - More elaborate cycle elimination (via the quotient)
- $\Rightarrow$  Generalize to richer unary languages for high arity?
  - Need construction for finite implication
  - Does the finite model construction adapt?

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Summary				

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#### Thanks for your attention!

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