



Tractable Lineages on Treelike Instances: Limits and Extensions

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Tuple independent databases (TID)

- **Probabilistic databases:** model **uncertainty** about data
- Simplest model: **tuple independent databases (TID)**
 - A **relational database** I
 - A **probability valuation** π mapping each fact of I to $[0, 1]$
- **Semantics** of a TID (I, π) : a **probability distribution** on $I' \subseteq I$:
 - Each fact $F \in I$ is either **present** or **absent** with probability $\pi(F)$
 - Assume **independence** across facts

Example: TID

S		
<i>a</i>	<i>a</i>	1
<i>b</i>	<i>v</i>	.5
<i>b</i>	<i>w</i>	.2

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$.5 \times .2$		$.5 \times (1 - .2)$	
<hr/>		<hr/>	
S		S	
<hr/>		<hr/>	
<i>a</i>	<i>a</i>	<i>a</i>	<i>a</i>
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Probabilistic query evaluation (PQE)

Let us fix:

- **Relational signature** σ
- Class \mathcal{I} of **relational instances** on σ (e.g., acyclic, treelike)
- Class \mathcal{Q} of **Boolean queries** (e.g., CQs, acyclic CQs)

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Probabilistic query evaluation (PQE) problem for \mathcal{Q} and \mathcal{I} :

- Fix a **query** $q \in \mathcal{Q}$
- Read an **instance** $I \in \mathcal{I}$ and a **probability valuation** π
- Compute the **probability** that (I, π) satisfies q
- **Data complexity**: measured as a function of (I, π)

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Question: what is the **complexity** of PQE
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 - PQE is **#P-hard** for any $q \in \mathcal{Q} \setminus \mathcal{S}$ on all instances
 - $q : \exists x y R(x) \wedge S(x, y) \wedge T(y)$ is **unsafe!**

Instance-based dichotomy

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- **Treewidth** measures how much data is close to a **tree**
 - **Trees** have treewidth **1**
 - **Cycles** have treewidth **2**
 - **k -cliques** and **$(k - 1)$ -grids** have treewidth **$k - 1$**

Main result: hardness of PQE

Theorem

For any arity-2 signature σ , there is a **first-order** query q such that for any constructible **unbounded-treewidth** class \mathcal{I} , the PQE problem for $\mathcal{Q} = \{q\}$ and \mathcal{I} is **#P-hard** under RP reductions

- **Arity-2**: Relations have arity ≤ 2 (and one has arity 2), i.e., **graphs**
- **Unbounded-treewidth**: for all $k \in \mathbb{N}$, there is $I_k \in \mathcal{I}$ of treewidth $\geq k$
- **Constructible**: given k , we can **compute** such an instance I_k in PTIME
- **#P-hard under RP reductions**: reduce in PTIME with high probability from the problem of counting accepting paths of a PTIME machine

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Introduction

Proof sketch

Extensions

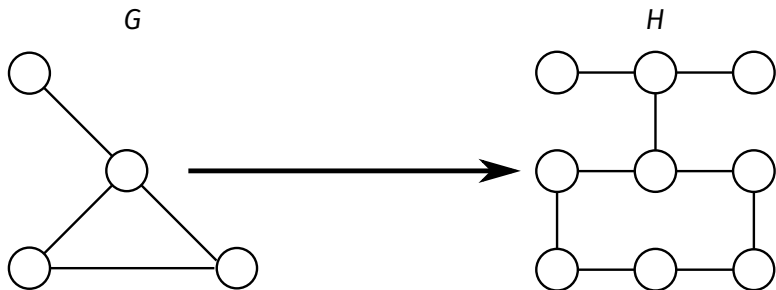
Conclusion

Idea: Topological minors

- G is a **topological minor** of H if:

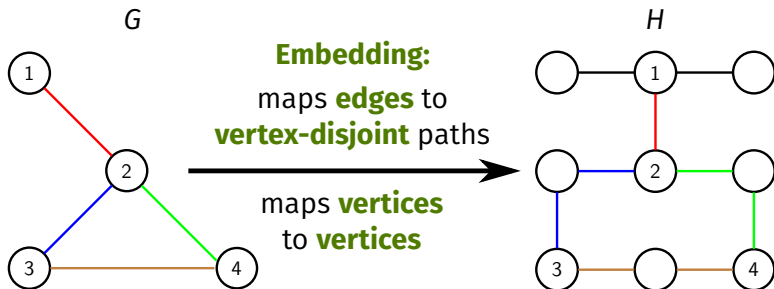
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More recently:

Theorem [Chekuri and Chuzhoy, 2014]

There is a certain constant $c \in \mathbb{N}$ such that
for any planar graph G of degree ≤ 3 and graph H of **treewidth $\geq |G|^c$** ,
we can embed G as a **topological minor** of H in PTIME with high proba

Proof sketch

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- Compute in PTIME an **instance I_k** of \mathcal{I} of treewidth $\geq k$
- Compute in randomized PTIME an **embedding** of G in I_k
- Construct a **probability valuation π** of I_k such that:
 - Unnecessary edges of I_k are removed
 - PQE for q **gives the answer** to the hard problem
 - Easy for MSO but **trickier** for FO

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Non-probabilistic evaluation

Apply [Chekuri and Chuzhoy, 2014] to method of [Ganian et al., 2014] for MSO **non-probabilistic** query evaluation (QE):

Theorem

*For any arity-2 signature σ and level Σ_i^P of the polynomial hierarchy, there is a **MSO** query q_i such that, for any constructible, **subinstance-closed**, **unbounded-tw** class \mathcal{I} , the QE problem for $\mathcal{Q} = \{q_i\}$ and \mathcal{I} is **Σ_i^P -hard** under RP reductions*

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Variant: we also show a result like in [Ganian et al., 2014], with:

- weaker **constructibility** requirement on \mathcal{I} :
 - \mathcal{I} is **densely unbounded poly-logarithmically**
- stronger **complexity hypothesis**:
 - PH does not admit $2^{o(n)}$ -sized circuits

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$c \quad r_3$	$b \quad w \quad s_3$	$b \quad t_3$

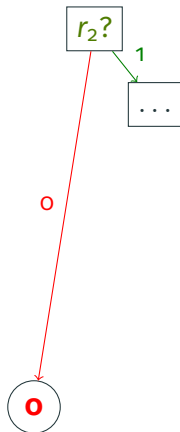
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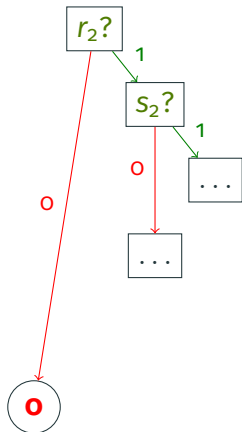
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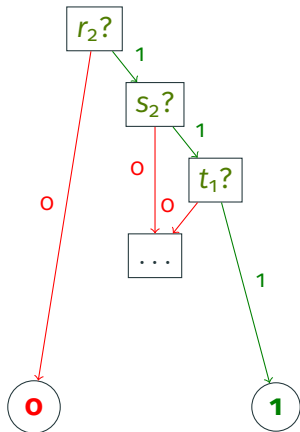
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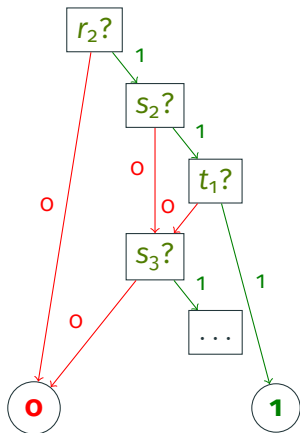
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OBDD for a query q on instance I :

ordered decision diagram on the facts of I to decide whether q holds

$$q : \exists x y R(x) \wedge S(x, y) \wedge T(y)$$

R		S			T	
a	r_1	a	a	s_1	v	t_1
b	r_2	b	v	s_2	w	t_2
c	r_3	b	w	s_3	b	t_3



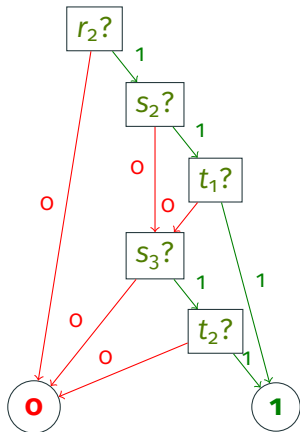
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Lower bound on OBDD representations (result)

- If we find an **OBDD** of q on I in PTIME, then **PQE** of q on I also is
- Show **inexistence of poly-size OBDDs** (rather than **PQE hardness**)

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For any arity-2 signature σ , there is a **UCQ with inequalities q** s.t. for any \mathcal{I} of treewidth **densely unbounded poly-logarithmically**, q has **no OBDDs of polynomial size** on instances of \mathcal{I}

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- **Meta-dichotomy** on the connected UCQ \neq for which this holds

Also in paper

- Hardness results for MSO **match counting**:
 - Count how many subsets X are such that I satisfies $q(X)$
- Connect the **tractability result** of MSO on treelike TID to the study of **tractable lineages**:
 - d-DNNFs, OBDDs, formulae, etc.
- Connect the same result to **tractability of safe queries**:
 - **Inversion-free** queries: subclass of safe queries, tractable OBDDs
 - We can always **rewrite** their input instances to **treelike instances** in a **lineage-preserving** way (hence, probability-preserving)

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Summary of our dichotomy

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Summary of our dichotomy

- Upper.** PQE for **MSO** on **treelike instances**
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- Lower.** PQE for **FO** on **any** constructible, arity-2, unbounded-tw
instance family is **#P-hard** under RP reductions

→ Bounded treewidth is **the right notion** for tractability of PQE

Future work

- Can we show #P-hardness under **usual P reductions**?
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PQE is hard on any constructible unbounded-tw family for:

$$q : (E(x, y) \vee E(y, x)) \wedge (E(y, z) \vee E(z, y)) \wedge x \neq z$$

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Thanks for your attention!

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Encoding treelike instances [Chaudhuri and Vardi, 1992]

Instance:

N

a b

b c

c d

d e

e f

S

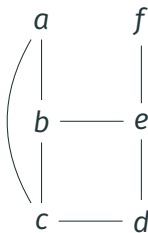
a c

b e

Encoding treelike instances [Chaudhuri and Vardi, 1992]

Instance: Gaifman graph:

N	
<i>a</i>	<i>b</i>
<i>b</i>	<i>c</i>
<i>c</i>	<i>d</i>
<i>d</i>	<i>e</i>
<i>e</i>	<i>f</i>

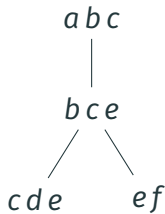
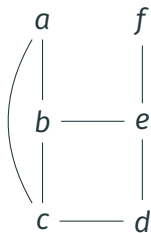


S	
<i>a</i>	<i>c</i>
<i>b</i>	<i>e</i>

Encoding treelike instances [Chaudhuri and Vardi, 1992]

Instance: Gaifman graph: Tree decomp.:

N	
<i>a</i>	<i>b</i>
<i>b</i>	<i>c</i>
<i>c</i>	<i>d</i>
<i>d</i>	<i>e</i>
<i>e</i>	<i>f</i>



S	
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<i>b</i>	<i>e</i>

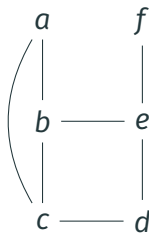
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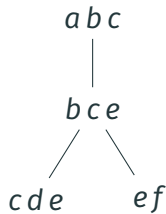
N	
<i>a</i>	<i>b</i>
<i>b</i>	<i>c</i>
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S	
<i>a</i>	<i>c</i>
<i>b</i>	<i>e</i>

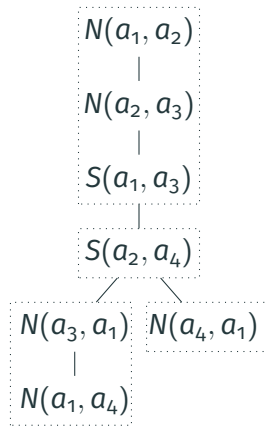
Gaifman graph:



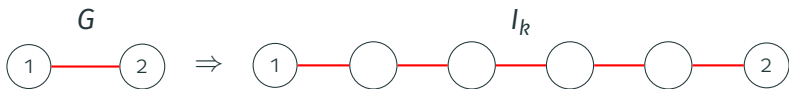
Tree decomp.:



Tree encoding:

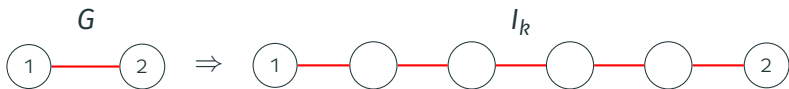


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- In the embedding, edges of G can become **long paths** in I_k
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 - Easy in MSO but tricky in FO!
- Our q restricts to a **subset of the worlds** of known weight and gives the right answer **up to renormalization**