# Probabilistic Graph Homomorphism: Combined Complexity 

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## Probabilistic Graph Homomorphism

Probabilistic instance graph:

- Each edge is present or absent with given probability
- Independence across edges

means

$\xrightarrow[45 \%]{\stackrel{R_{S}}{ }}$

15\%

Instance graph G Probability distribution on graphs

$$
\text { Query graph } \mathrm{G}_{\mathrm{Q}} \xrightarrow{R} \xrightarrow{S} \longleftarrow S
$$

Probabilistic graph homomorphism:

- INPUT: query graph $\mathrm{G}_{\mathrm{Q}}$ and probabilistic instance graph $\mathrm{G}_{1}$
- OUTPUT: probability that $G_{Q}$ has a homomorphism to $G_{1}$

Example: for $G_{Q}$ and $G_{1}$ above, prob. $=30 \%+10 \%=40 \%$

Known Results about Data Complexity

## Data complexity:

- Fix query graph $\mathrm{G}_{\mathrm{Q}}$
- Study the complexity as a function of $\left|G_{1}\right|$

Dalvi \& Suciu [1] imply:

- There is a class $S$ of safe query graphs
$\rightarrow$ Data complexity is PTIME if $G_{Q} \in S$
$\rightarrow$ Data complexity is \#P-hard if $\mathrm{G}_{\mathrm{Q}} \notin \mathrm{S}$
Amarilli \& al [2] imply:
- $G_{k}=$ all graphs of treewidth $<k$
$\rightarrow$ Data complexity of any query on $G_{k}$ is linear-time

What about the combined complexity? (complexity as a function of both $\left|G_{\mid}\right|$and $\left.\left|G_{Q}\right|\right)$

Problem
Study the combined complexity of the probabilistic graph homomorphism problem

## Our Graph Classes

We intoduce the following graph classes: one-way paths (1WP), two-way paths (2WP), downwards trees (DWT) and polytrees (PT)


Results
Without labels


With >1 labels


Proof Techniques

- Tree automata
- $\beta$-acyclicity
- X-property
- Various coding techniques for \#P-hardness (\#PP2DNF and \#Bipartite-Edge-Cover)

| References |
| :---: |
| [1] N. Dalvi, D. Suciu <br> The Dichotomy of Probabilistic Inference for Unions of JACM, 2012 |
| [2] A. Amarilli, P. Bourhis, P. Senellart <br> Provenance Circuits for Trees and Treelike Instances Proc. ICALP, 2015 |

Relationship between classes


ENS

Features

- Labeling
- Global orientation
- Branching
- (Connectedness)


## Conclusion

- First study of the combined complexity of Probabilistic Graph Homomorphism
- Shows the importance of various features
- Establishes complexity for all combinations of the graph classes we consider


## However:

- Graph classes very weak
- Nowhere near a dichotomy
- Probabilistic equivalent of Feder-Vardi conjecture for combined complexity?
- Practical application? (probabilistic databases)

