



Learning Aggregate Queries Defined by First-Order Logic with Counting

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Highlights 2024

How to be a Good Colleague

How to be a Good Colleague

Name	Popularity
Alice	5
Bob	1
Carol	2
Dan	3
Emma	1

(names changed for privacy reasons)

How to be a Good Colleague

Name	Popularity
Alice	5
Bob	1
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Dan	3
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Name	Type of Cake
Alice	chocolate
Dan	lemon
Carol	strawberry
Alice	chocolate
Bob	carrot
Emma	apple
Dan	chocolate
Alice	strawberry
Carol	lemon

How to be a Good Colleague

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Alice	5
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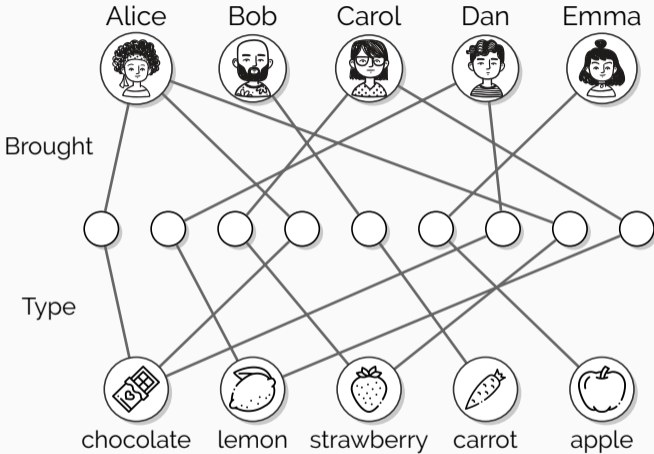
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Name	Type of Cake
Alice	chocolate
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Alice	chocolate
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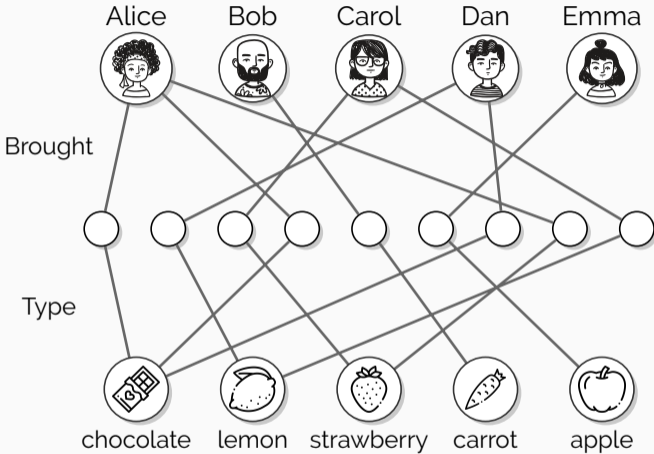
$$\text{Popularity} = 2 \cdot \#\text{chocolate cakes} + \#\text{other cakes}$$

How to be a Good Colleague

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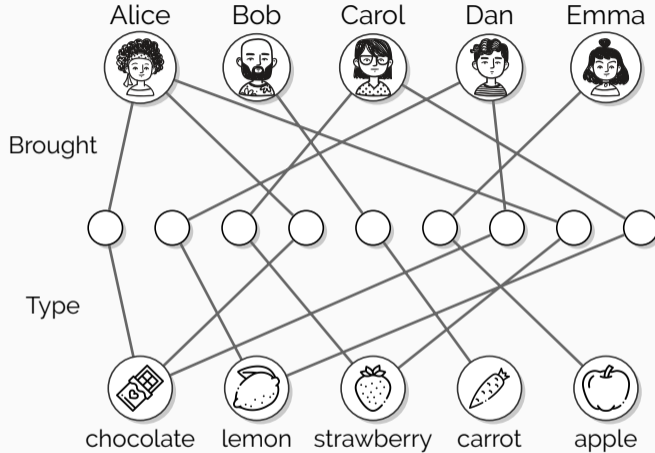


How to be a Good Colleague



- (Alice, 5)
- (Bob, 1)
- (Carol, 2)
- (Dan, 3)
- (Emma, 1)

How to be a Good Colleague

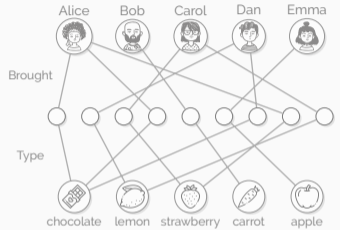


- (Alice, 5)
- (Bob, 1)
- (Carol, 2)
- (Dan, 3)
- (Emma, 1)

$$p(x) = 2 \cdot \#(c).(\text{Brought}(x, c) \wedge \text{Type}(c, \text{🍫})) + \#(c).(\text{Brought}(x, c) \wedge \neg \text{Type}(c, \text{🍫}))$$

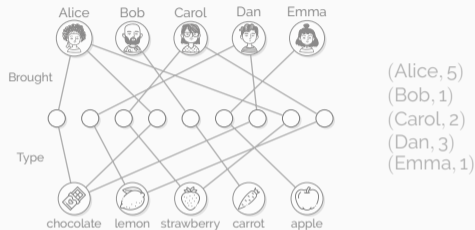
Learning from Examples

Precomputation: Given relational structure \mathcal{A} , build index structure



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Given list of labelled examples $(\bar{v}, \lambda) \in (U(\mathcal{A}))^k \times \mathbb{Z}$

Return term $t(\bar{x}) \in \text{FOC}_1$ (of certain maximum complexity)
such that $\llbracket t(\bar{v}) \rrbracket^{\mathcal{A}} = \lambda$ for all given examples (\bar{v}, λ)

or reject if there is no such term

Results on structures of small degree

Grohe and Ritzert, LICS 2017

Boolean-valued concepts definable in [first-order logic](#) can be learned in sublinear time.

v. B. and Schweikardt, CSL 2021

Boolean-valued concepts definable in [first-order logic with counting](#) or [first-order logic with weight aggregation](#) can be learned in sublinear time after quasi-linear-time precomputation.

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v. B. and Schweikardt, ICDT 2025

[Integer-valued](#) concepts definable in [first-order logic with counting](#) can be learned in sublinear time after quasi-linear-time precomputation.

Main tool: locality results similar to Gaifman normal forms

Results on structures of small degree

Grohe and Ritzert, LICS 2017

Boolean-valued concepts definable in **first-order logic** can be learned in sublinear time after quasi-linear-time precomputation.

Bring more (chocolate) cakes!

Come to the poster. There will be cookies.



v. B. and Schweikardt, ICDT 2025

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Main tool: locality results similar to Gaifman normal forms