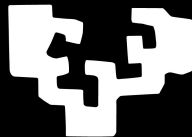


# The Logic of Counting Query Answers

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Act: Overview



# Query evaluation

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Basic problem in logic/database theory:

Evaluate a formula  $\phi(V)$  on a finite structure  $\mathbf{B}$ ,  
that is, determine  $\phi(\mathbf{B}) = \{h : V \rightarrow B \mid \mathbf{B}, h \models \phi\}$



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Example:  $\phi(u, v) = \exists x(E(u, x) \wedge E(x, v))$

Generalizes **model checking** — determine if  $\mathbf{B} \models \phi$   
where  $\phi$  is a sentence

- ▶ Here, we have  $|\phi(\mathbf{B})| = 1 \Leftrightarrow \mathbf{B} \models \phi$

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#-logic enjoys & balances:

- ▶ **Expressivity:** in a precise sense, can express known efficient algorithms for counting query answers in #-logic
- ▶ **Optimizability:** minimizing **width** can be done computably (in an expressive fragment of #-logic)





Act: Background



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**Def:**  $\text{p-count}(\Phi)$  is the problem...

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Here: the query/formula is the parameter

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**Here:**  $p\text{-count}(\Phi)$  is **tractable** if

$\exists$  an algorithm  $f$  and a poly-time algorithm  $A$  such that

given  $(\phi, \mathbf{B})$ , the value  $|\phi(\mathbf{B})|$  is computed by  $A(f(\phi), \mathbf{B})$

(“fixed-parameter tractable”)

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Let  $\Phi$  be a class of  $\{\exists, \wedge, \vee\}$ -formulas (of bounded arity).

- ▶ If  $(X)$ , then  $\text{p-count}(\Phi)$  is tractable (in FPT).
- ▶ Else,  $\text{p-count}(\Phi)$  is not tractable, unless  $W[1] = \text{FPT}$ .

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$\exists k \geq 1$  and an alg  $f$  that computes, for each  $\phi \in \Phi$ , a logically equiv sentence  $f(\phi)$  of width  $\leq k$

(By **model checking on a class of sentences  $\Phi$** , we refer to **p-count( $\Phi$ )**)

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Let  $\Phi$  be *any* class of  $\{\exists, \wedge, \vee\}$ -sentences (of bounded arity).

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**Conceptual point:** FO logic is a useful model of computation!

- ▶ If we have tractability at all, we have tractability via putting the sentences in the right “format”
- ▶ FO logic contains the computational primitives needed to express the algorithm witnessing tractability

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Will give a logic: **#-logic**



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**A Main Thm:** On classes  $\Phi$  of  $\{\exists, \wedge, \vee\}$ -formulas, this condition is **exclusive explanation** for FPT!

Example

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Consider the formula  $\phi(v, y, z) = E(v, y) \wedge F(v, z)$

Set  $\psi_E = C(E(v, y))$ ,  $\psi_F = C(F(v, z))$  (“casting”)

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...which is the num of exts  $\{v, y, z\} \rightarrow B$  of  $g$  satisfying  $\phi$
- ▶ So if we take the previous  $\sharp$ -formula and project  $v$ , get  
representation  $P_v(P_y \psi_E \times P_z \psi_F)$  of  $\phi$

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- ▶ **Expansion**

$Ev\phi$  is a  $\sharp$ -formula if  $\phi$  is a  $\sharp$ -formula,  $v \notin \text{free}(\phi) \cup \text{closed}(\phi)$

$\text{free}(Ev\phi) = \{v\} \cup \text{free}(\phi)$ ,  $\text{closed}(Ev\phi) = \text{closed}(\phi)$

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$\phi \times \phi'$ ,  $\phi + \phi'$  are #-formulas if  $\phi, \phi'$  are #-formulas with...

# #-logic: a summary

- ▶ **Casting**

$C(\phi)$  is a #-formula if  $\phi$  is a FO-formula

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- ▶ **Constants**

Each  $n \in \mathbb{Z}$  is a #-formula

$\text{free}(n) = \text{closed}(n) = \emptyset$



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**Note:** follows that there is an algorithm that decides counting equivalence

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- ▶ But to justify this...

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**Thm (independence):** For any “linear combination”  $\sum_i a_i |\psi_i\rangle$  where each  $a_i \neq 0$  and the  $\psi_i$  are counting inequivalent,  $\{\exists, \wedge\}$ , there exists a structure  $\mathbf{D}$  such that  $\sum_i a_i |\psi_i(\mathbf{D})| \neq 0$

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- ▶ Would like to control the values of components independently

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- ▶ To get the struct  $\mathbf{D}$  as described, take a poly  $p$  such that  $|\theta_i(\mathbf{C})| \mapsto t_i$ , and set  $\mathbf{D} = p(\mathbf{C})$

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**Act: Reflection**

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Our  $\#$ -logic balances...

- ▶ **Expressivity**
- ▶ **Computability:** there is an algorithm for **width minimization**, so width is well-characterized (in some sense)  
(Width minimization not computable in positive FO [Bova & Chen '14])

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**Open:** We focused on  $\{\exists, \wedge, \vee\}$ -formulas; what can one say about FO logic in general?

What can one say about other logics?