Descriptive complexity for counting complexity classes

Martín Muñoz

PUC Chile - IMFD

Joint work with Marcelo Arenas and Cristian Riveros Descriptive complexity has been very fruitful in connecting **logics** with **computational complexity**

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in connecting logics with computational complexity

 $NP \equiv \exists SO$

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NP	Ξ	∃SO
coNP	≡	∀SO
Р	≡	LFP≤
NL	≡	TC≤
AC_{0}	≡	FO+Bit
PSPACE	≡	PFP≤
÷	÷	:

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Many applications in diverse areas like:

- 1. Computational complexity and logics.
- 2. Database management systems.
- 3. Verification systems.

... but computational complexity

is not only about true or false

One would like to study the **complexity** of problems like:

"How many valuations satisfies my boolean formula?"

... but computational complexity is not only about true or false

One would like to study the complexity of problems like:

"How many valuations satisfies my boolean formula?"

"How many simple paths are connecting two vertices in my graph?" ... but computational complexity is not only about true or false

> #P SpanP FP #L #PSPACE :

... but computational complexity

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Counting complexity classes #P SpanP FP #L #PSPACE : ... but computational complexity

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	#P	≡	?
Counting complexity classes	SpanP	≡	?
	\mathbf{FP}	≡	?
	#L	≡	?
	#PSPACE	≡	?
	. :	÷	÷

How can we describe these counting classes with logic?

We propose to use:

Quantitative Second Order Logics (QSO) = Weighted Logics over \mathbb{N}

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We propose to use:

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Specifically, our contributions are:

- 1. We show that QSO captures many counting complexity classes.
 - #P, SpanP, FP, #PSPACE, MinP, MaxP, ...
- We use QSO to find classes below #P that have good tractability and closure properties.
- 3. We show how to define **quantitative recursion** over QSO in order to capture classes below FP.

Outline

Quantitative second order logic

QSO vs counting complexity

Below and beyond

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QSO vs counting complexity

Below and beyond

Given a relational signature $\mathbf{R} = \{R_1, \dots, R_k, <\}$, we consider finite ordered structures over \mathbf{R} of the form:

$$\mathfrak{A} = (A, R_1^{\mathfrak{A}}, \ldots, R_k^{\mathfrak{A}}, <^{\mathfrak{A}})$$

where A is the domain and $<^{\mathfrak{A}}$ is a linear order over A.

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We consider formulas of Second Order logic over R of the form:

$$\varphi := \operatorname{True} \ | \ x = y \ | \ R(\bar{u}) \ | \ X(\bar{v}) \ | \ \neg \varphi \ | \ (\varphi \lor \varphi) \ | \ \exists x. \ \varphi \ | \ \exists X. \ \varphi$$

where $R \in \mathbf{R}$ and x and X are a first and second order variable, respectively.

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where $R \in \mathbf{R}$ and x and X are a first and second order variable, respectively.

The semantics of a second order formula is defined as usual.

Definition

A QSO-formula α over **R** is given by the following syntax:

 $\alpha := \varphi \in \mathsf{SO} \mid s \mid (\alpha + \alpha) \mid (\alpha \cdot \alpha) \mid \Sigma x. \alpha \mid \Pi x. \alpha \mid \Sigma X. \alpha \mid \Pi X. \alpha$

where φ is a (boolean) second order formula and $s \in \mathbb{N}$.

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Example

Let **R** = { $E(\cdot, \cdot)$, <} where *E* encodes an edge relation.

 $\alpha := \Sigma x. \Sigma y. \Sigma z. (E(x, y) \land E(y, z) \land E(z, x) \land x < y \land y < z)$

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Example

Let **R** = { $E(\cdot, \cdot)$, <} where *E* encodes an edge relation.

$$\alpha := \Sigma x. \Sigma y. \Sigma z. \left(\underbrace{E(x,y) \land E(y,z) \land E(z,x) \land x < y \land y < z}_{} \right)$$

SO formula φ

$$\llbracket \varphi \rrbracket (\mathfrak{A}, v) = \begin{cases} 1 & \text{if } (\mathfrak{A}, v) \vDash \varphi \\ 0 & \text{otherwise} \end{cases}$$

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$$\llbracket s \rrbracket (\mathfrak{A}, v) = s$$

$$\llbracket \varphi \rrbracket (\mathfrak{A}, \mathbf{v}) = \begin{cases} 1 & \text{if } (\mathfrak{A}, \mathbf{v}) \models \varphi \\ 0 & \text{otherwise} \end{cases}$$
$$\llbracket \mathbf{s} \rrbracket (\mathfrak{A}, \mathbf{v}) = \mathbf{s} \\\llbracket \alpha_1 + \alpha_2 \rrbracket (\mathfrak{A}, \mathbf{v}) = \llbracket \alpha_1 \rrbracket (\mathfrak{A}, \mathbf{v}) + \llbracket \alpha_2 \rrbracket (\mathfrak{A}, \mathbf{v}) \\\llbracket \alpha_1 \cdot \alpha_2 \rrbracket (\mathfrak{A}, \mathbf{v}) = \llbracket \alpha_1 \rrbracket (\mathfrak{A}, \mathbf{v}) \cdot \llbracket \alpha_2 \rrbracket (\mathfrak{A}, \mathbf{v}) \end{cases}$$

$\llbracket \varphi \rrbracket (\mathfrak{A}, \mathbf{v})$	=	$\begin{cases} 1 & \text{if } (\mathfrak{A}, \mathbf{v}) \vDash \varphi \\ 0 & \text{otherwise} \end{cases}$
$\llbracket s \rrbracket (\mathfrak{A}, v)$	=	5
$[\alpha_1 + \alpha_2](\mathfrak{A}, \mathbf{v})$	=	$\llbracket \alpha_1 \rrbracket (\mathfrak{A}, \mathbf{v}) + \llbracket \alpha_2 \rrbracket (\mathfrak{A}, \mathbf{v})$
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$[\![\boldsymbol{\Sigma}\boldsymbol{x}.\boldsymbol{\alpha}]\!](\mathfrak{A},\boldsymbol{v})$	=	$\sum_{\mathbf{a}\in A} \llbracket \alpha \rrbracket (\mathfrak{A}, \mathbf{v}[\mathbf{a}/x])$
$[\![\Pi x.\alpha]\!](\mathfrak{A},v)$	=	$\prod_{\mathbf{a}\in A} \llbracket \alpha \rrbracket (\mathfrak{A}, \mathbf{v}[\mathbf{a}/\mathbf{x}])$

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$[\![\boldsymbol{\Sigma}\boldsymbol{X}.\boldsymbol{\alpha}]\!](\mathfrak{A},\boldsymbol{v})$	=	$\sum_{C \subseteq A^{\operatorname{arity}(X)}} \llbracket \alpha \rrbracket (\mathfrak{A}, v[C/X])$
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Example (counting the triangles in a graph)



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 $\mathsf{triangle}(x,y,z) \ \coloneqq \ E(x,y) \land E(y,z) \land E(z,x) \land x < y \land y < z$
Example (counting the triangles in a graph)



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 $[[triangle]](\mathfrak{A},3,4,5) = 1$

Example (counting the triangles in a graph)



 $\mathsf{triangle}(x, y, z) := E(x, y) \land E(y, z) \land E(z, x) \land x < y \land y < z$

 $[[triangle]](\mathfrak{A},3,4,5) = 1 \qquad [[triangle]](\mathfrak{A},1,2,3) = 0$

Example (counting the triangles in a graph)



 $\mathsf{triangle}(x,y,z) \; \coloneqq \; E(x,y) \, \land \, E(y,z) \, \land \, E(z,x) \, \land x < y \, \land \, y < z$

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 $\llbracket \alpha \rrbracket (\mathfrak{A}) = 3$

Example (counting the number of cliques in a graph)



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 $\mathsf{clique}(X) \coloneqq \forall x. \ \forall y. \ (X(x) \land X(y) \land x \neq y) \to E(x,y)$

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Example (counting the number of cliques in a graph)



 $\alpha := \Sigma X. \operatorname{clique}(X)$

 $\llbracket \alpha \rrbracket (\mathfrak{A}) = 18$

 $\alpha := \varphi \in \mathsf{SO} \mid s \mid (\alpha + \alpha) \mid (\alpha \cdot \alpha) \mid \Sigma x. \alpha \mid \Pi x. \alpha \mid \Sigma X. \alpha \mid \Pi X. \alpha$

 $\alpha := \varphi \in SO \mid s \mid (\alpha + \alpha) \mid (\alpha \cdot \alpha) \mid \Sigma x. \alpha \mid \Pi x. \alpha \mid \Sigma X. \alpha \mid \Pi X. \alpha$ $QSO = \underbrace{QSO}_{\alpha} \underbrace{(SO)}_{\alpha}$

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$$\mathsf{QSO} = \underbrace{\mathsf{QSO}}_{\alpha} (\overbrace{\mathsf{SO}}^{\varphi})$$

We can restrict or extend the language of φ :

 $QSO(FO) := \varphi$ is restricted to **FO logic**.

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We can restrict or extend the language of α :

QFO(SO) := α is restricted to first order operators (i.e. $s, +, \cdot, \Sigma x, \Pi x$.).

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We can restrict or extend the language of α :

Or both φ and α :

 $QFO(LFP) = \alpha$ is restricted to first order operators and φ is restricted to LFP logic.

Outline

Quantitative second order logic

QSO vs counting complexity

Below and beyond

• Recall that a counting complexity $C \subseteq \{f : \Sigma^* \to \mathbb{N}\}.$

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Definition

Let ${\mathcal F}$ be a fragment or extension of QSO and ${\mathcal C}$ a counting complexity class.

• Recall that a counting complexity $C \subseteq \{f : \Sigma^* \to \mathbb{N}\}.$

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Definition

Let \mathcal{F} be a fragment or extension of QSO and \mathcal{C} a counting complexity class. Then \mathcal{F} captures \mathcal{C} over ordered **R**-structures if:

1. for every $\alpha \in \mathcal{F}$, there exists $f \in \mathcal{C}$ such that $[\alpha](\mathfrak{A}) = f(\operatorname{enc}(\mathcal{A}))$ for every $\mathfrak{A} \in \operatorname{Struct}[\mathbf{R}]$.

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- 2. for every $f \in C$, there exists $\alpha \in \mathcal{F}$ such that $f(\text{enc}(\mathcal{A})) = [\![\alpha]\!](\mathfrak{A})$ for every $\mathfrak{A} \in \text{Struct}[\mathbf{R}]$.

- Recall that a counting complexity $C \subseteq \{f : \Sigma^* \to \mathbb{N}\}.$
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- 2. for every $f \in C$, there exists $\alpha \in \mathcal{F}$ such that $f(\text{enc}(\mathcal{A})) = [\![\alpha]\!](\mathfrak{A})$ for every $\mathfrak{A} \in \text{Struct}[\mathbf{R}]$.

 $\mathcal{F} \mbox{ captures } \mathcal{C} \mbox{ over ordered structures if } \mathcal{F} \mbox{ captures } \mathcal{C} \mbox{ over ordered } R \mbox{-structures for every signature } R.$

What counting classes can be captured by QSO?

	(#P
Counting complexity < classes	SpanP
	FP
	/ #L
	#PSPACE
	l :

What counting classes can be captured by QSO?



We show that most of these classes can be captured by subfragments or extensions of QSO

$f \in \#P$ iff there exists an **NP machine** M such that $f(x) = \#accepts_M(x)$ for all $x \in \Sigma^*$.

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Theorem Σ QSO(FO) captures #P over ordered structures.

 $\#P \equiv \Sigma QSO(FO)$

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 $f \in \text{SPANP}$ iff there exists an **NP** machine *M* with output such that $f(x) = \#\text{outputs}_M(x)$ for all $x \in \Sigma^*$.

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- $f \in \text{SPANP}$ iff there exists an **NP** machine *M* with output such that $f(x) = \#\text{outputs}_M(x)$ for all $x \in \Sigma^*$.
- $\Sigma QSO(\exists SO) := \alpha \text{ restricted to sum operators (i.e. } s, +, \Sigma x., \Sigma X.)$ and φ restricted to existential SO logic.

 $\#P \equiv \Sigma QSO(FO)$

- $f \in \text{SPANP}$ iff there exists an **NP machine** M with **output** such that $f(x) = \#\text{outputs}_M(x)$ for all $x \in \Sigma^*$.
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Theorem $\Sigma QSO(\exists SO)$ captures SpanP over ordered structures.

 $\#P \equiv \Sigma QSO(FO)$

- $f \in \text{SPANP}$ iff there exists an **NP machine** M with **output** such that $f(x) = \#\text{outputs}_M(x)$ for all $x \in \Sigma^*$.
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Theorem $\Sigma QSO(\exists SO)$ captures SpanP over ordered structures.

 $\begin{array}{lll} \# \mathrm{P} & \equiv & \Sigma \mathsf{QSO}(\mathsf{FO}) \\ \mathrm{SPANP} & \equiv & \Sigma \mathsf{QSO}(\exists \mathsf{SO}) \end{array}$
How to capture FP?

$$\begin{array}{rcl} \# \mathrm{P} & \equiv & \boldsymbol{\Sigma} \mathsf{QSO}(\mathsf{FO}) \\ \mathrm{SPANP} & \equiv & \boldsymbol{\Sigma} \mathsf{QSO}(\exists \mathsf{SO}) \end{array}$$

 $f \in FP$ iff there exists a **PTIME machine** *M* with output such that f(x) = M(x) for all $x \in \Sigma^*$.

How to capture FP?

$$#P \equiv \Sigma QSO(FO)$$

SpanP $\equiv \Sigma QSO(\exists SO)$

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Theorem QFO(LFP) captures FP over ordered structures.

How to capture $\ensuremath{\operatorname{FPSPACE}}\xspace$

#P	≡	$\Sigma QSO(FO)$
SpanP	≡	$\Sigma QSO(\exists SO)$
\mathbf{FP}	≡	QFO(LFP)

How to capture FPSPACE?

#P	≡	$\Sigma QSO(FO)$
SpanP	≡	ΣQSO(∃SO)
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 $f \in \text{FPSPACE}$ iff there exists a **PSPACE machine** M with output such that f(x) = M(x) for all $x \in \Sigma^*$.

How to capture FPSPACE?

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 $f \in \text{FPSPACE}$ iff there exists a **PSPACE machine** M with output such that f(x) = M(x) for all $x \in \Sigma^*$.

 $QSO(PFP) := \varphi$ restricted to **PFP logic**.

How to capture FPSPACE?

#P	≡	$\Sigma QSO(FO)$
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 $f \in \text{FPSPACE}$ iff there exists a **PSPACE machine** M with output such that f(x) = M(x) for all $x \in \Sigma^*$.

 $QSO(PFP) := \varphi$ restricted to **PFP logic**.

Theorem

QSO(PFP) captures FPSPACE over ordered structures.

#P	≡	$\Sigma QSO(FO)$
SpanP	≡	$\Sigma QSO(\exists SO)$
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Theorem QFO(PFP) captures FPSPACE(poly) over ordered structures.

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MAXP	≡	MaxQSO(FO)
MinP	≡	MinQSO(FO)

Outline

Quantitative second order logic

QSO vs counting complexity

Below and beyond

Use QSO to understand classes below $\#\mathrm{P}$

 $\#P \equiv \Sigma QSO(FO)$

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We consider subfragments below FO:

$$\begin{split} \Sigma_{0} &= \left\{ \begin{array}{ll} \theta \in \mathsf{FO} \ | \ \theta \text{ has no first-order quantifiers} \end{array} \right\} \\ \Sigma_{1} &= \left\{ \begin{array}{ll} \varphi \in \mathsf{FO} \ | \ \varphi = \exists \bar{x}. \ \theta(\bar{x}) \ \land \ \theta \in \Sigma_{0} \end{array} \right\} \\ \Pi_{1} &= \left\{ \begin{array}{ll} \varphi \in \mathsf{FO} \ | \ \varphi = \forall \bar{x}. \ \theta(\bar{x}) \ \land \ \theta \in \Sigma_{0} \end{array} \right\} \\ \Sigma_{2} &= \left\{ \begin{array}{ll} \varphi \in \mathsf{FO} \ | \ \varphi = \exists \bar{x}. \ \forall \bar{y}. \ \theta(\bar{x}, \bar{y}) \ \land \ \theta \in \Sigma_{0} \end{array} \right\} \\ \Pi_{2} &= \left\{ \begin{array}{ll} \varphi \in \mathsf{FO} \ | \ \varphi = \forall \bar{x}. \ \exists \bar{y}. \ \theta(\bar{x}, \bar{y}) \ \land \ \theta \in \Sigma_{0} \end{array} \right\} \end{split}$$

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Theorem (good decision and closure properties) The class $\Sigma QSO(\Sigma_1[FO])$ is closed under sum, multiplication and subtraction by one. Moreover, $\Sigma QSO(\Sigma_1[FO]) \subseteq TOTP$ and every function in $\Sigma QSO(\Sigma_1[FO])$ has an FPRAS.

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In this setting, the existence of a small witness (in this case σ) is essential to have closure by subtraction by one.

Extend QSO to capture complexity classes beyond QSO
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Theorem

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Thanks! Questions?