Unifying Graded Linear Logic and Differential Operators

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Background:

Our contributions:

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- Linear logic via its semantics
- Differential linear logic
- Its extension to D-DiLL
- Graded linear logic

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 - A syntactical differentiation of graded LL
 - A graded extension of D-DiLL
- Are they the same?

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- Are they the same?

D-DiLL: $!_D$ (D an LPDOcc) B_SLL : $!_s$ (s in a semiring) QUESTION: Can we unify those two notions? Yes!

Mathematical analysis

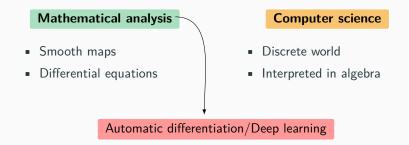
- Smooth maps
- Differential equations

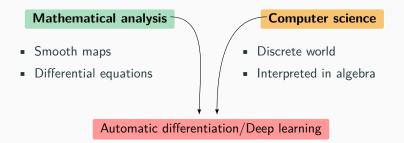
Computer science

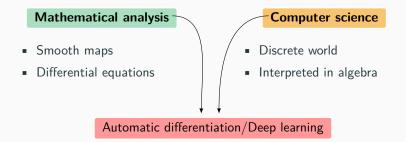
- Discrete world
- Interpreted in algebra

Automatic differentiation/Deep learning

Motivations







- Probabilistic programming, differentiable programming,...
- Can we merge these ideas? Thanks to proof theory?

Computer science	Logic	Mathematics
fun $(x:A) \rightarrow (y:B)$	Proof of $A \vdash B$	$f: A \to B$
Types	Formulae	Objects
Execution	Cut-elimination	Equality

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<pre></pre>		
concrete models :	categor	ical semantics :
Precise description	 Generaliz 	zed description
Respects categorical sema	ntics Encompa	ass every model

Linear logic. Girard (1987)

Computer science	Logic	Mathematics
Proof nets	Linear logic	Linear algebra

$$A \Rightarrow B = !A \multimap B$$

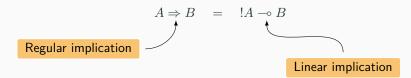
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$$A \Rightarrow B = !A \multimap B$$
Regular implication

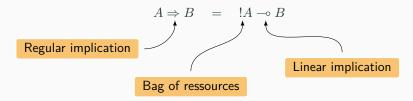
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Linear logic. Girard (1987)

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1. Background

Linear Logic

Multiplicative Additive Linear Logic (MALL) :

- 1. A grammar : $A, B := X | X^{\perp} | A \otimes B | A \otimes B | ...$
- 2. A (involutive) negation : $(A \ \mathfrak{P} B)^{\perp} := A^{\perp} \otimes B^{\perp} | \dots$

3. A set of rules

$$\frac{}{\vdash A, A^{\perp}} ax \qquad \frac{\vdash \Gamma, A^{\perp} \vdash \Delta, A^{\perp}}{\vdash \Gamma, \Delta} cut \qquad \frac{\vdash \Gamma, A, B}{\vdash \Gamma, A \ \mathfrak{B}} \ \mathfrak{P}$$

. . .

Linear Logic

Multiplicative Additive Linear Logic (MALL) :

- 1. A grammar : $A, B := X | X^{\perp} | A \otimes B | A \Im B | \dots$
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Linear Logic :

- Two exponentials connectives : !A and ?A, with $(!A)^{\perp} := ?A$
- A set of exponential rules

$$\frac{\Gamma\vdash\Delta}{\Gamma, !A\vdash\Delta} \ \mathsf{w} \qquad \frac{\Gamma, !A, !A\vdash\Delta}{\Gamma, !A\vdash\Delta} \ \mathsf{c} \qquad \frac{\Gamma, A\vdash\Delta}{\Gamma, !A\vdash\Delta} \ \mathsf{d} \quad \frac{!\Gamma\vdash!A}{!\Gamma\vdash A} \ \mathsf{P}$$

The smooth semantics

Formulas :

- Each MALL formula is a finite dimentional vector space : $\llbracket 1 \rrbracket := \mathbb{R} \quad \llbracket A \otimes B \rrbracket := \llbracket A \rrbracket \otimes \llbracket B \rrbracket \quad \llbracket A \oplus B \rrbracket := \llbracket A \rrbracket \uplus \llbracket B \rrbracket \quad \dots$
- The exponentials are interpreted by infinite dimensional vector spaces : $[\![?A]\!] := \mathcal{C}^{\infty}([\![A]\!]', \mathbb{R})$ $[\![!A]\!] := \mathcal{C}^{\infty}([\![A]\!], \mathbb{R})'$
- Negation is duality : $\llbracket A^{\perp} \rrbracket := \llbracket A \rrbracket' = \mathcal{L}(\llbracket A \rrbracket, \mathbb{R})$

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Proofs :

• Each proof is a **linear** map between the interpretation of the formulas.

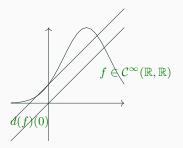
•
$$A \Rightarrow B = !A \multimap B$$
 is $\mathcal{C}^{\infty}(A, B) \simeq \mathcal{L}(!A, B)$

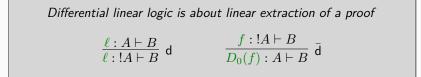
• The dereliction states that $\mathcal{L}(A,B) \subseteq \mathcal{C}^{\infty}(A,B)$: it forgets the linearity.

Differential Linear Logic



Differential interaction nets. Ehrhard, Regnier (2006)





Differential Linear Logic

• Other rules has to be added

$$\frac{\vdash \Gamma}{\vdash \Gamma, ?A} \text{ w} \qquad \qquad \frac{\vdash \Gamma, ?A, ?A}{\vdash \Gamma, ?A} \text{ c} \qquad \qquad \frac{\vdash \Gamma, A}{\vdash \Gamma, ?A} \text{ d} \qquad \qquad \frac{\vdash ?\Gamma, A}{\vdash ?\Gamma, !A} \text{ p}$$

Differential Linear Logic

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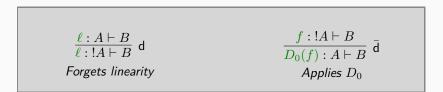
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$$\frac{\vdash \Gamma, !A \vdash \Delta, !A}{\vdash \Gamma, \Delta, !A} \bar{\mathsf{c}} \qquad \frac{\vdash \Gamma, A}{\vdash \Gamma, !A} \bar{\mathsf{d}}$$

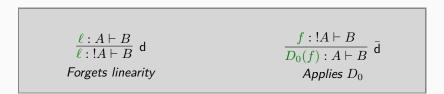
• They have nice mathematical interpretation

 \overline{d}/p is the chain rule



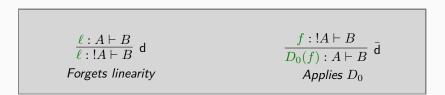


Solution of $D_0(_) = \ell$? That is ℓ since $D_0(\ell) = \ell$

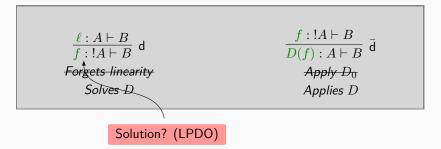


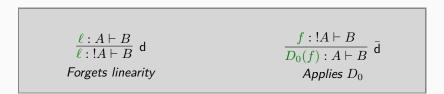
Solution of $D_0(\underline{}) = \ell$? That is ℓ since $D_0(\ell) = \ell$



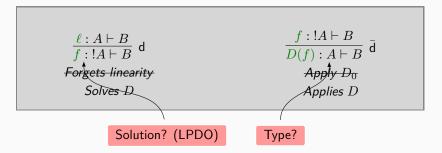


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Solution of $D_0(\underline{}) = \ell$? That is ℓ since $D_0(\ell) = \ell$



 $\begin{array}{c} \hline \textbf{Definition} \\ \textbf{A LPDOcc is a linear operator defined as} \\ D = \sum_{\alpha \in \mathbb{N}^n} a_\alpha \frac{\partial^{|\alpha|}}{\partial x_1^{\alpha_1} \dots \partial x_n^{\alpha_n}} \qquad (a_\alpha \in \mathbb{R}) \end{array}$

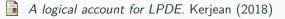
- A LPDO acts on smooth maps, or distributions.
- A fundamental solution is a distribution Φ_D s.t. $D(\Phi_D) = \delta_0$

Examples of LPDOcc: $D: f \mapsto \frac{\partial}{\partial x_1}f + 3\frac{\partial^2}{\partial x_1\partial x_3}f$, or the heat equation.

Theorem (Malgrange-Ehrenpreis, 50's)

Each LPDOcc D has a unique fundamental solution Φ_D .

DiLL indexed by a LPDOcc

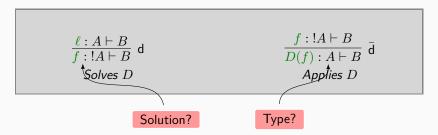


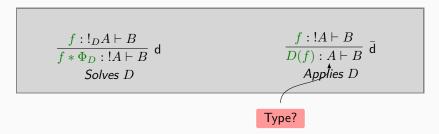
- Two new exponentials connectives : $!_D A$ and $?_D A$
- Their interpretations in the smooth semantics :

 $[\![?_DA]\!] := D(\mathcal{C}^{\infty}([\![A]\!]', \mathbb{R})) \qquad [\![!_DA]\!] := (D(\mathcal{C}^{\infty}([\![A]\!], \mathbb{R})))'$

which respect duality and reflexivity.

• We have
$$!_{D_0}A \simeq A$$





$$\begin{array}{c} \displaystyle \frac{f: !_D A \vdash B}{f \ast \Phi_D: !A \vdash B} \ \mathsf{d} & \qquad \displaystyle \frac{f: !A \vdash B}{D(f): !_D A \vdash B} \ \bar{\mathsf{d}} \\ \hline & \\ \displaystyle \text{Solves } D & \qquad & \\ \end{array}$$

A graded version?

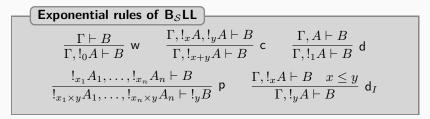
- Our exponential is indexed, can we connect with other frameworks?
- Is there an interaction?
- LPDOcc are well-behaved:

$$\Phi_{D_1 \circ D_2} = \Phi_{D_1} * \Phi_{D_2}$$

Graded linear logic

A core quantitative coeffect calculus. Brunel et. al (2014)

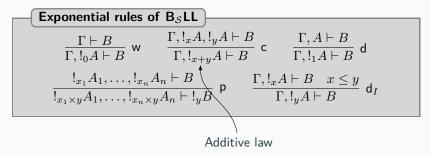
Combining Effects and Coeffects via Grading. Gaboardi et. al (2016)



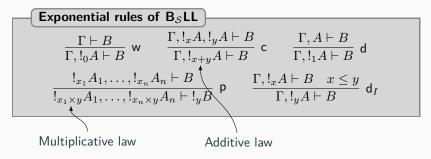
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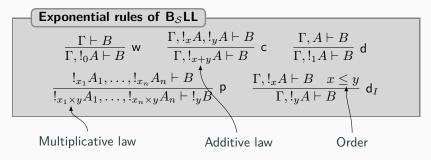
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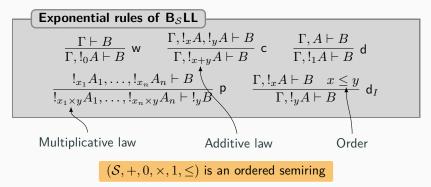
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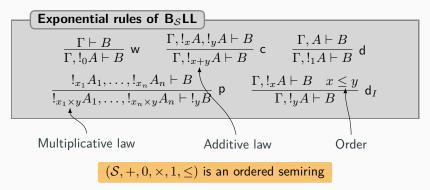
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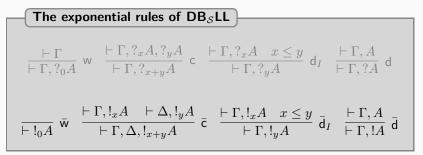
A core quantitative coeffect calculus. Brunel et. al (2014)



- Type system for ressource consumption
- Coeffect analysis

2. A graded differential linear logic

- A syntactical differentiation of $\mathsf{B}_{\mathcal{S}}\mathsf{LL}$



- A syntactical differentiation of $\mathsf{B}_{\mathcal{S}}\mathsf{LL}$

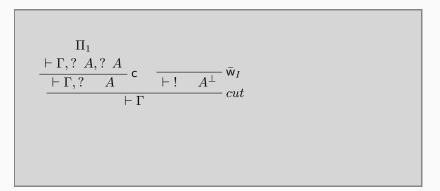
$$\begin{array}{c} \hline \textbf{The exponential rules of DB}_{\mathcal{S}}\textbf{LL} \\ \\ \hline \vdash \Gamma,?_{0}A & \forall \quad \frac{\vdash \Gamma,?_{x}A,?_{y}A}{\vdash \Gamma,?_{x+y}A} \leftarrow \quad \frac{\vdash \Gamma,?_{x}A \quad x \leq y}{\vdash \Gamma,?_{y}A} \quad \textbf{d}_{I} \quad \frac{\vdash \Gamma,A}{\vdash \Gamma,?A} \quad \textbf{d} \\ \\ \hline \hline \vdash !_{0}A \quad \bar{\forall} \quad \frac{\vdash \Gamma,!_{x}A \quad \vdash \Delta,!_{y}A}{\vdash \Gamma,\Delta,!_{x+y}A} \quad \bar{c} \quad \frac{\vdash \Gamma,!_{x}A \quad x \leq y}{\vdash \Gamma,!_{y}A} \quad \bar{\textbf{d}}_{I} \quad \frac{\vdash \Gamma,A}{\vdash \Gamma,!A} \quad \bar{\textbf{d}} \end{array}$$

- A syntactical differentiation of $\mathsf{B}_\mathcal{S}\mathsf{LL}$

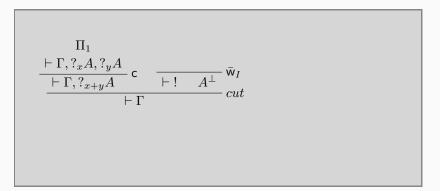
$$\begin{array}{c} \hline \textbf{The exponential rules of DB}_{\mathcal{S}}\textbf{LL} \\ \\ \hline \begin{array}{c} \vdash \Gamma \\ \vdash \Gamma,?_{0}A \end{array} & \texttt{w} \quad \begin{array}{c} \vdash \Gamma,?_{x}A,?_{y}A \\ \vdash \Gamma,?_{x}+yA \end{array} \texttt{c} \quad \begin{array}{c} \vdash \Gamma,?_{x}A \quad x \leq y \\ \vdash \Gamma,?_{y}A \end{array} \texttt{d}_{I} \quad \begin{array}{c} \vdash \Gamma,A \\ \vdash \Gamma,?A \end{array} \texttt{d} \\ \\ \hline \begin{array}{c} \end{array} \\ \hline \begin{array}{c} \end{array} \\ \hline \begin{array}{c} \vdash !_{0}A \end{array} \\ \hline \texttt{w} \quad \begin{array}{c} \vdash \Gamma,!_{x}A \quad \vdash \Delta,!_{y}A \\ \vdash \Gamma,\Delta,!_{x+y}A \end{array} \\ \hline \texttt{c} \quad \begin{array}{c} \vdash \Gamma,!_{x}A \quad x \leq y \\ \vdash \Gamma,!_{y}A \end{array} \\ \hline \textbf{d}_{I} \quad \begin{array}{c} \vdash \Gamma,A \\ \vdash \Gamma,!A \end{array} \\ \hline \end{array} \\ \hline \end{array} \\ \end{array}$$

• Question: what is the dynamic of this logic?

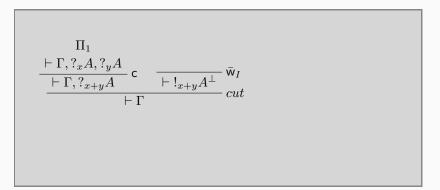
• Naive solution: Decorate the one from DiLL



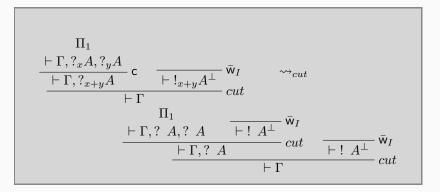
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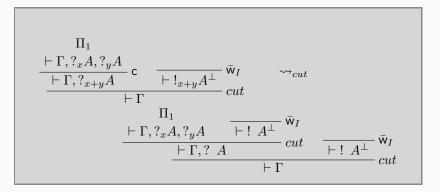
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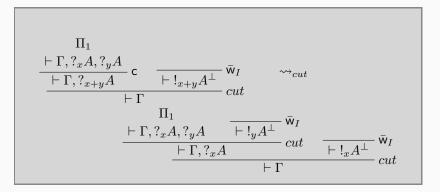
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$$\begin{array}{c|cccc} \Pi_1 & \Pi_2 & \Pi_3 \\ \hline & + \Gamma, ?_{x_1} A^{\perp}, ?_{x_2} A^{\perp} \\ \hline & + \Gamma, ?_{x_1 + x_2} A^{\perp} \end{array} \mathsf{c} & \begin{array}{c} + \Delta, ! & A & + \Xi, ! & A \\ \hline & + \Delta, \Xi, ! & A \\ \hline & + \Delta, \Xi, ! & A \end{array} \bar{\mathsf{c}} \\ \hline & & \mathsf{cut} \end{array}$$

$$\frac{ \begin{array}{ccc} \Pi_1 & \Pi_2 & \Pi_3 \\ \hline + \Gamma, ?_{x_1} A^{\perp}, ?_{x_2} A^{\perp} \\ \hline + \Gamma, ?_{x_1 + x_2} A^{\perp} \end{array} \mathsf{c} & \frac{\vdash \Delta, ! \quad A \quad \vdash \Xi, ! \quad A}{\vdash \Delta, \Xi, !_{x_1 + x_2} \quad A} \bar{\mathsf{c}} \\ \hline + \Gamma, \Delta, \Xi & cut \end{array}$$

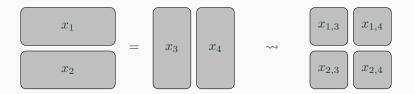
$$\frac{ \begin{array}{ccc} \Pi_1 & \Pi_2 & \Pi_3 \\ \hline + \Gamma, ?_{x_1} A^{\perp}, ?_{x_2} A^{\perp} \\ \hline \hline + \Gamma, ?_{x_1 + x_2} A^{\perp} \end{array} \mathsf{c} & \frac{\vdash \Delta, ! \quad A \quad \vdash \Xi, ! \quad A}{\vdash \Delta, \Xi, !_{x_1 + x_2 = x_3 + x_4} A} \bar{\mathsf{c}} \\ \hline + \Gamma, \Delta, \Xi & cut \end{array}$$

$$\frac{ \begin{array}{ccc} \Pi_1 & \Pi_2 & \Pi_3 \\ \hline + \Gamma, ?_{x_1} A^{\perp}, ?_{x_2} A^{\perp} & \mathsf{c} & \hline + \Delta, !_{x_3} A & \vdash \Xi, !_{x_4} A \\ \hline \hline + \Gamma, ?_{x_1+x_2} A^{\perp} & \mathsf{c} & \hline + \Gamma, \Delta, \Xi & cut \end{array}}{ \vdash \Gamma, \Delta, \Xi \\ \end{array} \\$$

Definition

A monoid $(\mathcal{M}, +, 0)$ is additive splitting if for each $x_1, x_2, x_3, x_4 \in \mathcal{M}$ such that $x_1 + x_2 = x_3 + x_4$, there are elements $x_{1,3}, x_{1,4}, x_{2,3}, x_{2,4} \in \mathcal{M}$ such that

$$x_1 = x_{1,3} + x_{1,4}$$
 $x_2 = x_{2,3} + x_{2,4}$ $x_3 = x_{1,3} + x_{2,3}$ $x_4 = x_{1,4} + x_{2,4}$



Cut elimination III

- Issue: indexed (co)derelictions do not exist in DiLL
- Solution: (co)derelicitons will go up in the tree (subtyping idea)

$$\frac{\prod_{\substack{\vdash \Gamma \\ \vdash \Gamma, ?_{x}A}} {\mathbb{W}_{I}} \mathsf{w}_{I} \xrightarrow{\rightsquigarrow_{\mathsf{d}_{I}, 3}} \frac{\prod_{\substack{\vdash \Gamma \\ \vdash \Gamma, ?_{x+y}A}} \mathsf{w}_{I}$$

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Combining these three parts, we get:

Theorem

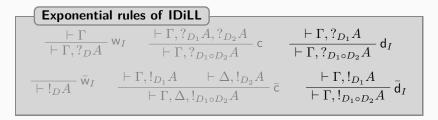
The logic $\mathsf{DB}_{\mathcal{S}}\mathsf{LL}$ has a cut elimination procedure when $\mathcal S$ is additive splitting.

Let $\ensuremath{\mathcal{D}}$ be the set of LPDOcc.

$$\mathcal{D} \simeq \mathbb{R}[X_1, \dots, X_n, \dots]$$
$$\left(D = \sum_{\alpha \in \mathbb{N}} k_\alpha \frac{\partial^{|\alpha|}}{\partial x_1^{\alpha_1} \dots x_n^{\alpha_n}}\right) \mapsto \left(P = \sum_{\alpha \in \mathbb{N}} k_\alpha X_1^{\alpha_1} \dots X_n^{\alpha_n}\right)$$

Proposition The set of LPDOcc, endowed with composition, is an additive splitting commutative monoid.

3. From differential operators to ressources



From d_D to d_I : syntax has to change, and semantics as well

 $\llbracket !_D A \rrbracket = D(\mathcal{C}^{\infty}(\llbracket A \rrbracket, \mathbb{R})') \qquad \llbracket ?_D A \rrbracket = D^{-1}(\mathcal{C}^{\infty}(\llbracket A \rrbracket', \mathbb{R}))$

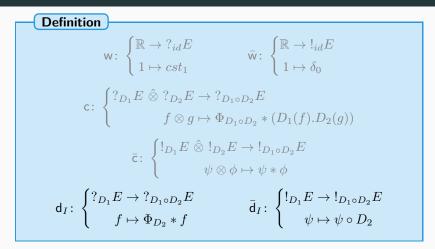
• An order on LPDOcc:

$$D_1 \le D_2 \iff \exists D_3, \ D_2 = D_1 \circ D_3$$

Dereliction in both logics:

$$\frac{\vdash \Gamma, ?_{x}A \quad x \leq y}{\vdash \Gamma, ?_{y}A} \, \mathsf{d}_{I} \qquad \simeq \qquad \frac{\vdash \Gamma, ?_{D_{1} \circ D_{2}}A}{\vdash \Gamma, ?_{D_{1}}A} \, \mathsf{d}_{I}$$

The smooth semantics for IDiLL



Theorem

The smooth semantics is **compatible** with the cut-elimination procedure.

An example for the compatibility

The syntax of the interaction between indexed dereliction and weakening:

$$\frac{\prod_{\substack{\vdash \Gamma \\ \vdash \Gamma, ?_{D_1}A}} \mathsf{w}_I}{\vdash \Gamma, ?_{D_1 \circ D_2}A} \mathsf{d}_I \xrightarrow{\sim}_{\mathsf{d}_I, 3} \frac{\prod_{\substack{\vdash \Gamma \\ \vdash \Gamma, ?_{D_1 \circ D_2}A}} \mathsf{w}_I$$

Its semantical interpretation:

$$\frac{\prod\limits_{\vdash} \Psi_{D_1} * cst_1}{\vdash \Phi_{D_2} * \Phi_{D_1} * cst_1} \mathsf{d}_I \xrightarrow{\sim \mathsf{d}_I, 3} \frac{\prod}{\vdash} \Phi_{D_1 \circ D_2} * cst_1} \mathsf{w}_I$$

• Well known result: $\Phi_{D_1} * \Phi_{D_2} = \Phi_{D_1 \circ D_2}$

Take away:

- Two approaches which are the same
- A semantics with correct intuition:
 - Dereliction solves the equation
 - Codereliction apply it
- A syntax closer to the graded idea
- A calculus which uses various ideas

The promotion rule:

- What would be the product rule of the semiring?
- How can we extend our work on higher-order? Spaces of functions/distributions are infinite-dimensional

Other questions:

- What about the categorical semantics?
- Can we extend this to other operators? D-finite/holonomic functions?

QUESTIONS ?