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# A logical account for Linear Partial Differential Equations

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#### Differential Linear Logic

Smooth classical models

Distributions

#### LPDEs

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# Differential Linear Logic

#### Smoothness

#### Differentiation

Differentiating a function  $f : \mathbb{R}^n \to \mathbb{R}$  at x is finding a linear approximation  $d(f)(x) : v \mapsto d(f)(x)(v)$  of f near x.



#### A coinductive definition

Smooth functions are functions which can be differentiated everywhere in their domain and whose differentials are smooth.

Distribution

LPDEs

#### Linear Logic

#### A decomposition of the implication

 $A \Rightarrow B \simeq !A \multimap B$ 

#### Denotational semantic

We interpret formulas as sets and proofs as functions between these sets.

#### Denotational semantic of LL

We have a cohabitation between linear functions and non-linear functions.

# Differentiating proofs

Differentiation was in the air since the study of Analytic functors by Girard :

$$\bar{d}(x):\sum f_n\mapsto f_1(x)$$

 DiLL was developed after a study of vectorial models of LL inspired by coherent spaces : Finiteness spaces (Ehrhard 2005), Köthe spaces (Ehrhard 2002).



Normal functors, power series and  $\lambda$ -calculus. Girard, APAL(1988)



Differential interaction nets, Ehrhard and Regnier, TCS (2006)

# Differential Linear Logic: Semantics

DiLL is a modification of the exponential rules of Linear Logic in order to allow differentiation.

#### Differentiation

For each  $f : !A \multimap B \simeq C^{\infty}(A, B)$ , we have an interpretation for its differential at 0:

 $D_0f: A \multimap B$ 

Exponential connectives

 $?E \simeq \mathcal{C}^{\infty}(E', \mathbb{R})$  $!E \simeq \mathcal{C}^{\infty}(E, \mathbb{R})'$ 

A typical inhabitant of !E is  $ev_x : f \in \mathcal{C}^{\infty}(E, \mathbb{K}) \mapsto f(x)$ .

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# (Differential) Linear Logic is classical

In Linear Logic, negation is linear :

 $A^{\perp} := A \multimap \bot.$ 

Linear Logic and Differential Linear Logic are classical :

 $A^{\perp\perp}\simeq A$ 

This classicality *must* translates into semantics. When formulas are interpreted by vector spaces it implies :

 $\llbracket A^{\perp} \rrbracket := \mathcal{L}(\llbracket A \rrbracket, \mathbb{R}) = \llbracket A \rrbracket'$  $\llbracket A \rrbracket'' \simeq \llbracket A \rrbracket$  $ev_{x} \mapsto x$ 

We want a model of *reflexive* vector spaces.

#### LPDEs

# Differential Linear Logic : Syntax

$$A,B:=A\otimes B|1|A \ {\mathfrak P} \ B|\bot|A \oplus B|0|A imes B|\top|!A|?A$$



Interactions between linearity and non linearity

$$\bar{d}: \begin{cases} E \to !E \\ x \mapsto (f \mapsto D_0(f)(x)) \end{cases} \qquad d: \begin{cases} !E \to E \\ \psi \mapsto \psi_{E'} \in E'' \simeq E \end{cases}$$

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## Differential Linear Logic : Syntax



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Interactions between linearity and non linearity

$$\bar{d}:\begin{cases} E'' \to \mathcal{C}^{\infty}(E,\mathbb{R})' \\ ev_{x} \mapsto (f \mapsto ev_{x}(D_{0}(f))) \end{cases} \quad d:\begin{cases} \mathcal{C}^{\infty}(E,\mathbb{R})' \to E \\ \psi \mapsto \psi_{E'} \in E'' \simeq E \end{cases}$$

### The computational content of differentiation

Historically, resource sensitive syntax and discrete semantics

- Quantitative semantics :  $f = \sum_n f_n$
- Resource  $\lambda$ -calculus and Taylor formulas :  $M = \sum_n M_n$

Nowadays, differentiation in computer science is motivated by the study of continuous data:

- Differential Geometry and functional analysis
- Ordinary and Partial Differential Equations



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Can we match the requirement of models of LL with the intuitions of physics ? (YES, we can.)

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# Smooth and classical models of Differential Linear Logic

#### Topological vector spaces

We work with Hausdorff topological vector spaces : real or complex vector spaces endowed with a Hausdorff topology making addition and scalar multiplication continuous.

#### Two layers: algebraic and topological constructions

- The topology on E determines E' as a vector space.
- The topology on E' determines whether  $E \simeq E''$ .
- ► Many topologies on E ⊗ F which may or may not make it associative.

We work within the category  ${\rm TOPVECT}$  of topological vector spaces and continuous linear functions between them.

#### Challenges

We encounter several difficulties in the context of topological vector spaces :

- Finding a category of lcs and smooth functions which is Cartesian closed. Requires some completeness
- Interpreting the involutive linear negation (E<sup>⊥</sup>)<sup>⊥</sup> ≃ E The topology should not be too fine so as to not allow too many linear continuous scalar forms

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- Convenient differential category Blute, Ehrhard Tasson Cah. Geom. Diff. (2010) New: reflexive with the Mackey dual
  - Mackey-complete spaces and Power series, K. and Tasson, MSCS 2016.

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Weak topologies for Linear Logic, K. LMCS 2015. Involves a topology which is an internal Chu construction.

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- A model of LL with Schwartz' epsilon product, Dabrowski and K., Preprint.
- ► A logical account for PDEs, K., LICS18

#### LPDEs

#### What's not working

A space of (non necessarily linear) functions between finite dimensional spaces is not finite dimensional.

dim  $\mathcal{C}^0(\mathbb{R}^n,\mathbb{R}^m)=\infty.$ 

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The tentative to have a normed space of analytic functions fails (Girard's Coherent Banach spaces).

- We want to use power series.
- For polarity reasons, we want the supremum norm on spaces of power series.
- But a power series can't be bounded on an unbounded space (Liouville's Theorem).
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- This is why Coherent Banach spaces don't work.

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#### We can't restrict ourselves to normed spaces.

#### Duality in topological vector spaces

A subcategory of TOPVECT is  $\star$ -autonomous *iff* its objects are reflexive  $E \simeq E''$ .

It's a mess.

- ▶ It depends of the topology  $E'_{\beta}$ ,  $E'_{c}$ ,  $E'_{w}$ ,  $E'_{\mu}$  on the dual.
- It is typically not preserved by  $\otimes$ .
- ▶ It is in the canonical case not an orthogonality  $E'_{\beta}$  is not reflexive.

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# Smooth maps à la Frölicher, Kriegl and Michor

A smooth curve  $c : \mathbb{R} \to E$  is a curve infinitely many times differentiable.



A smooth function  $f : E \to F$  is a function sending a smooth curve on a smooth curve.

In Banach spaces, the definition coincides with the usual one (all iterated derivatives exists and are continuous).

# A model with higher order smooth functions

A smooth curve  $c : \mathbb{R} \to E$  is a curve infinitely many times differentiable.

A smooth function  $f : E \to F$  is a function sending a smooth curve on a smooth curve.

#### A model of IDiLL

This definition leads to a cartesian closed category of Mackey-complete bornological spaces and smooth functions, and to a first smooth model of Intuitionist DiLL <sup>a</sup>.

<sup>&</sup>lt;sup>a</sup>A Convenient differential category, Blute, Ehrhard Tasson Cah. Geom. Diff. (2010)

# Nuclear spaces and distributions a smooth classical model

without higher order ... but it can be enhanced

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# Distributions are everywhere

▶ Distributions with compact support are elements of C<sup>∞</sup>(ℝ<sup>n</sup>, ℝ)', seen as generalisations of functions with compact support :

$$\phi_f:g\in\mathcal{C}^\infty(\mathbb{R}^n,\mathbb{R})\mapsto\int fg.$$

► In a classical model of Differential Linear Logic :  $|A \rightarrow A \Rightarrow A$ 

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In a classical model of Differential Linear Logic :

$$\begin{array}{l} |A \multimap \bot = A \Rightarrow \bot \\ \mathcal{L}(!E, \mathbb{R}) \simeq \mathcal{C}^{\infty}(E, \mathbb{R}) \\ (!E)'' \simeq \mathcal{C}^{\infty}(E, \mathbb{R})' \\ \underline{!E} \simeq \mathcal{C}^{\infty}(E, \mathbb{R})' \end{array}$$

In  $\operatorname{KOTHE}$  and  $\operatorname{CONV},$  distributions with compact support arise as a particular case.

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#### Topological models of DiLL



Let us take the other way around, through Nuclear Fréchet spaces.

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# Fréchet and DF spaces

- Fréchet : metrizable complete spaces.
- (DF)-spaces : such that the dual of a Fréchet is (DF) and the dual of a (DF) is Fréchet.



These spaces are in general not reflexive.

Distributions

#### Nuclear spaces

Nuclear spaces are spaces in which one can identify the two canonical topologies on tensor products :

 $\forall F, E \otimes_{\pi} F = E \otimes_{\varepsilon} F$ 



#### LPDEs

#### Nuclear spaces

#### A polarized \*-autonomous category

A Nuclear space which is also Fréchet or dual of a Fréchet is reflexive.



Distributions

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#### Nuclear spaces

We get a polarized model of MALL : involutive negation (\_)^\_,  $\otimes$ ,  $\Im,$   $\oplus,$   $\times.$ 



# Distributions and the Kernel theorems

A typical Nuclear Fréchet space is the space of smooth functions on  $\mathbb{R}^n$  :

 $\mathcal{C}^{\infty}(\mathbb{R}^{n},\mathbb{R}).$ 

A typical Nuclear DF spaces is Schwartz' space of distributions with compact support :

 $\mathcal{C}^{\infty}(\mathbb{R}^n,\mathbb{R})':=\{\phi:f\in\mathcal{C}^{\infty}(\mathbb{R}^n,\mathbb{R})\mapsto\phi(f)\in\mathbb{R}\}.$ 

The Kernel Theorems

 $\mathcal{C}^{\infty}(E,\mathbb{R})'\hat{\otimes}\mathcal{C}^{\infty}(F,\mathbb{R})'\simeq\mathcal{C}^{\infty}(E imes F,\mathbb{R})'$ 

 $!\mathbb{R}^n = \mathcal{C}^\infty(\mathbb{R}^n, \mathbb{R})'.$ 

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# A model of Smooth differential Linear Logic



# A Smooth differential Linear Logic

#### Smooth DiLL

Finitary formulas Euclidean spaces:  $A, B := X | A \otimes B | A \Im B | A \oplus B | A \times B.$ Smooth formulas Nuclear F/DF spaces:  $U, V := A | !A | ?A | U \otimes V | U \Im V | U \oplus V | U \times V.$ 

#### A polarized model of Smooth DiLL

Functions are **smooth** and **exponential** are distributions.

No higher order : we don't have an obvious way to construct a Nuclear DF lcs  $!E = C^{\infty}(E, R)'$  when E is any Nuclear Fréchet lcs.

A toy semantics to understand the computational content of Partial Differential Equations.

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#### A Type Theory for Linear Partial Differential Equations

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#### Linear functions as solutions to a Differential equation

$$f \in \mathcal{C}^{\infty}(\mathbb{R}^n, \mathbb{R})$$
 is linear

$$\begin{array}{l} \text{iff } \forall x, f(x) = D(f)(0)(x) \\ \text{iff } f = \bar{d}(f) \\ \text{iff } \exists g \in \mathcal{C}^{\infty}(\mathbb{R}^n, \mathbb{R}), f = \bar{d}g \end{array}$$

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#### Linear functions as solutions to a Differential equation

$$f \in \mathcal{C}^{\infty}(\mathbb{R}^{n}, \mathbb{R}) \text{ is linear } \quad iff \ \forall x, f(x) = D(f)(0)(x)$$
$$iff \ f = \overline{d}(f)$$
$$iff \ \exists g \in \mathcal{C}^{\infty}(\mathbb{R}^{n}, \mathbb{R}), f = \overline{d}g$$

#### Another definition for $\bar{d}$

A linear partial differential operator D acts on  $\mathcal{C}^{\infty}(\mathbb{R}^n, R)$ , and is extended on  $\mathcal{C}^{\infty}(\mathbb{R}^n, R)'$ :

$$D(g)(x) = \sum_{|\alpha| \le n} a_{\alpha}(x) \frac{\partial^{\alpha} g}{\partial x^{\alpha}}.$$

# LPDE with constant coefficient

Consider D a LPDO with constant coefficients :



The heat equation in  $\mathbb{R}^2$  $\frac{\partial^2 u}{\partial x^2} - \frac{\partial u}{\partial t} = 0$ u(x, y, 0) = f(x, y)



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Then we know how to solve :  $\phi = D\psi, \psi \in C^{\infty}(\mathbb{R}^n, \mathbb{R})'$  and this is done through an algebraic structure on a specific exponential  $!_D$ .

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#### Another exponential is possible

 $!_D E = (D(\mathcal{C}^\infty_c(E,\mathbb{R})))'$ 

that is the space of linear functions acting on functions f = Dg, for  $g \in C_c^{\infty}(E, \mathbb{R})$ , when  $E \subset \mathbb{R}^n$  for some *n*.

$$\bar{d}_D: \begin{cases} !_D E \to !E \\ \phi \mapsto (f \mapsto \phi(D(f))) \end{cases} \quad d_D: \begin{cases} !E \to !_D E \\ \psi \mapsto \psi_{|D(\mathcal{C}^{\infty}(A))} \end{cases}$$

Getting back to LL when  $D = D_0$  $!_{D_0}A \simeq \mathcal{L}(A, \mathbb{R})' \simeq A$  by reflexivity.

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Getting back to LL when  $D = D_0$  $!_{D_0}A \simeq \mathcal{L}(A, \mathbb{R})' \simeq A$  by reflexivity.

# An algebraic structure on $!_D A = (D(\mathcal{C}^{\infty}_{c}(A, \mathbb{R})))'$

Existence of a fundamental solution (Malgrange, Ehrhenpeis) For such D there is  $E_D \in C^{\infty}_c(A)'$  such that  $E_D \circ D = ev_0$ .

 $\bar{w}_D : \mathbb{R} \to !_D E, 1 \mapsto E_D$ 

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# *D* an LPDOcc commutes with convolution If $f \in D(\mathcal{C}^{\infty}_{c}(A))$ and $g \in \mathcal{C}^{\infty}(A)$ , then $f * g \in D(\mathcal{C}^{\infty}_{c}(A))$ .

 $\bar{c}_D : !E \otimes !_D E \to !_D E, (\phi, \psi) \mapsto D(\phi) * \psi$ 

#### Intermediates rules for D



#### Syntax for $!_D$ in D - DiLL



#### A deterministic cut-elimination.

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#### LPDEs

# Solving the LPDE

Consider  $\psi \in \mathcal{C}^{\infty}(E, \mathbb{R})'$ : the distribution  $\phi \in !_{D}E$  such that

 $D\phi := \phi \circ D = \psi,$ 

*i.e.* such that for any  $f \in \mathcal{C}^\infty(E,\mathbb{R})$  :  $\phi(Df) = \psi(f)$ , is

 $\phi = E_D * \psi.$ 



$$\frac{\vdash \mathsf{\Gamma}, \psi: !E \vdash \Delta, f: ?E^{\perp}}{\vdash \mathsf{\Gamma}, \Delta} \mathsf{cut}$$

### Conclusion

#### Take aways

- What is done in DiLL with differentiation can be done with any Linear Partial Differential Operator with constant coefficients.
- Differentiation in logic is linear classical and polarized.

#### Further work: Theorical computer science and Analysis

- Higher order with distributions : ongoing with JS Lemay. Also Dabrowski, K.
- Curry-Howard : a deterministic PDE calculus.
- Most importantly : towards non-linear PDEs.
- ► Fourier transformation, Sobolev spaces, Subtyping.

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# A coalgebraic structure on D

#### Weakening

 $w :!_D E \to \mathbb{R}$  comes from  $t : E \to \{0\}$ .

If  $E = \mathbb{R}^n$ , define  $\mathbb{R}^{n'}$  another copy of E. Then

$$D(\mathcal{C}^{\infty}(E,\mathbb{R})) \to D(\mathcal{C}^{\infty}(E \times E,\mathbb{R}))$$
  
=  $D(\mathcal{C}^{\infty}(\mathbb{R}^{n} \times \mathbb{R}^{n'},\mathbb{R}))$   
=  $D(\mathcal{C}^{\infty}(E,\mathbb{R}) \operatorname{\mathcal{P}} \mathcal{C}^{\infty}(\mathbb{R}^{n'},\mathbb{R}))$   
=  $D(\mathcal{C}^{\infty}(E,\mathbb{R})) \operatorname{\mathcal{P}} \mathcal{C}^{\infty}(\mathbb{R}^{n'},\mathbb{R})$ 

#### Contraction

We thus have  $c :!_D E \to !E \otimes !_D E$ .

# What's typable with D-DiLL

Consider *D* a Smooth Linear Partial Differential Operator : D :  $C^{\infty}(E) \rightarrow C^{\infty}(E)$ . *D* acts on  $E \times E$  :

$$\hat{D} = (D \otimes \mathit{Id}_{F})\mathcal{C}^{\infty}(E imes E, \mathbb{R}) o \mathcal{C}^{\infty}(E imes E, \mathbb{R})$$

Then Green's function is the operator  $K_{x,y}$  :! E to! E such that :

$$K_{x,y} \circ (\hat{D})' = \delta_{x-y}$$



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## A closer look to Kernels

A answer to a well-known issue :

- Any k ∈ (L<sub>p</sub>(μ ⊗ η))' gives rise to a compact operator
  T<sub>k</sub> : L<sub>p</sub>(μ) → L<sub>p\*</sub>(η) ≃ (L<sub>p</sub>(η))' : T<sub>k</sub>(f)(g) = k(f.g).
- ► This is not a surjection : if p = p\* = 2, for T<sub>k</sub> = Id one should have k = δ<sub>x-y</sub>, which is not a function.
- ► The above morphism k → T<sub>k</sub> is an isomorphism on spaces of distributions spaces, generalizing L<sub>p</sub> :

Kernel theorems

$$egin{aligned} \mathcal{L}(\mathcal{C}^\infty(E,\mathbb{R})',\mathcal{C}^\infty(F,\mathbb{R})'')&\simeq\mathcal{C}^\infty(E,\mathbb{R})'\hat{\otimes}\mathcal{C}^\infty(F,\mathbb{R})'\ &\simeq\mathcal{C}^\infty(E imes F,\mathbb{R})'\ &T_k\mapsto \mathcal{K}_{\mathrm{x},\mathrm{y}} \end{aligned}$$

#### LPDEs

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Kernel theorems

$$\mathcal{C}^{\infty}(E,\mathbb{R})'\hat{\otimes}\mathcal{C}^{\infty}(F,\mathbb{R})'{\simeq}\mathcal{L}(\mathcal{C}^{\infty}(E,\mathbb{R})',\mathcal{C}^{\infty}(F,\mathbb{R})')\ {\simeq} \mathcal{C}^{\infty}(E imes F,\mathbb{R})'$$

#### Nuclearity

#### LPDEs

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Density