# <span id="page-0-0"></span>**Grothendieck toposes and the geometry of language elaborations**

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London CSTT Workshop, British Library, June 3-4, 2024

Note: this presentation has been largely inspired by exchanges with O. Caramello.

# **The core question of language elaboration:**

# **Starting remarks:**

- Mathematics does not consist only in deriving consequences from axioms in a given language.
- It also consists in enlarging or changing the language in order to get new insights.

# **Striking examples:**

• Descartes' analytic geometry:

from the language of ancient geometry to algebra.

• Newton's physics:

from the language of time series to differential calculus.

• Galois' theory:

from the language of algebraic equations

to the language of symmetry groups and group actions.

# **AI problems as problems of language changes:**

• LLM: coding texts as vectors

in a way which makes approximation techniques efficient.

- Image recognition: from pixels to words.
- Deep learning: moving from an input language to an output language

through mysterious intermediate layers.

# **A key difficulty and an overlooked question:**

# **The difficulty of jumps:**

Usually, we don't move from a language to another language

in a continuous way nor even through easy intermediate steps.

**Ex:** Descartes, Newton, Galois made genius jumps.

#### **Consequence:**

DNN systems which would be "meaningful" are hard to imagine.

 $\rightarrow$  Maybe intermediate languages between

an input language and an output language do not exist?

 $\rightarrow$  Maybe an approximation process

such as gradient descent backward propagation cannot be meaningful?

### **The overlooked question of choosing a starting description language:**

**Ex:** The language of pixels for representing images should be open to question.

 $\rightarrow$  For instance, could images be represented in terms of more or less precise qualitative descriptions of distinguishable contours

and the connected components of their complement?

# **The necessity of formalized languages and their elements:**

If we want machines to deal with some languages,

they have to be formalized languages, i.e. the type of languages used in mathematics.

# **Elements of mathematical languages:**

- Vocabulary:
- $\sqrt{ }$ − names of "objects" i.e. of "spaces of variables" *G*, *F*, *V*, *A*, *B*, · · ·
- $\frac{1}{2}$ 
	- − names of maps in a family of variables *f* : *A*<sub>1</sub> · · · *A<sub>n</sub>* → *B*<br>− names of relations in a family of variables  $R \rightarrowtail A_1 \cdots A_n$
- Substitution:

 $\mathcal{L}$ 

- $-\overline{\mathsf{replacing\ a\ variable\ } x^B}$  by a function  $f(x_1^{A_1}\cdots x_n^{A_n})$
- Logical symbols allowing to form first-order formulas:
- $-$  truth, finite and infinite conjunctions  $\top, \wedge, \bigwedge$
- $-$  false, finite and infinite disjunctions  $\bot, \vee, \bigvee$
- − negation ¬
- <sup>−</sup> implication <sup>⇒</sup>
- − existential and universal quantifiers ∃, ∀
- Formation of quotients by equivalence relations.
- Second-order constructions:  $(A, B) \longmapsto B^A = \mathcal{H} \text{om}(A, B)$  $A \longmapsto \mathcal{P}(A) = \Omega^A$
- Interpretations: They always exist in Set and, more generally, in any topos  $\mathcal{E}$ .

### **Geometrization of logic:**

**Theorem (dating back to the 1970's)**. – *For any first-order theory* T *wich is "geometric" (meaning its axioms only use the symbols* ⊤, ∧, ⊥, W , ∃*), there exists an associated "topos"* (= *generalized space*)  $\varepsilon_{\text{T}}$  such that *interpretations* = *"models"*  $\int$  $\mathfrak{t}$ *M of*  $\mathbb T$  *in a topos*  $\mathcal E$  $\mathcal{L}$ J ←→  $\sqrt{ }$  $\int$  $\mathfrak{t}$ *"topos morphisms"* (= *generalized continuous maps*)  $\mathcal{E} \rightarrow \mathcal{E}_{\mathbb{T}}$  $\mathcal{L}$  $\mathcal{L}$ J  $\sqrt{ }$  *change of parameters*  $\mathcal{L}$ *for models M* in  $\mathcal{E} \mapsto f^*M$  in  $\mathcal{E}'$   $\int$  $\mathcal{L}$  $\cdot$  ( ←→ *composition with topos morphisms*  $\int$  $\overline{\mathcal{L}}$  $f : \mathcal{E}' \to \mathcal{E}$  $(\mathcal{E} \to \mathcal{E}_{\mathbb{T}}) \mapsto (\mathcal{E}' \xrightarrow{f} \mathcal{E} \to \mathcal{E}_{\mathbb{T}})$  $\overline{\mathcal{L}}$  $\int$  *interpretation of a formula*  $\frac{1}{2}$  $\mathcal{L}$  $\frac{\varphi(x_1^{A_1} \cdots x_n^{A_n})}{\varphi(x_1^{A_1} \cdots x_n^{A_n})}$ *in a model M of*  $\mathbb T$  *in*  $\mathcal E$  $\left\{\n\begin{array}{ccc}\n\longleftarrow & \left\{\n\begin{array}{c}\n\text{embedding in } \mathcal{E} \\
M\varphi & \rightarrow MA_1 \times \cdots \times\n\end{array}\n\end{array}\n\right\}$  $M\varphi \hookrightarrow MA_1 \times \cdots \times MA_n$  $\mathcal{L}$ 

#### **Remarks:**

• In particular, set-valued models M of T

correspond to "points": point topos Pt = {topos of sets}  $\rightarrow \mathcal{E}_{\mathbb{T}}$ .

• For <u>any model</u> *M* of  $\mathbb T$  in  $\mathcal E$ , any geometric formula  $\varphi$ , and <u>any</u>  $f : \mathcal E' \to \mathcal E$ ,

$$
f^*(M\phi)\overset{\sim}{\longrightarrow}(f^*M)\phi\ .
$$

 $f^*(M\varphi) \stackrel{\sim}{\longrightarrow} (f^*M)\varphi$ .<br>► For more general formulas, there is only a natural morphism in  $\mathcal E$ 

$f^*(M\varphi) \longrightarrow (f^*M)\varphi$ .	June 3-4, 2024	5/16	
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# **Semantics and geometry:**

### **Definition (originately introduced by Tarski)**. –

*The semantics of a theory* T *(considered as a syntactic object) consists in its "models" in* {*sets*} *(and, more generally, in an arbitrary topos* E*).*

**Corollary**. – *For any first-order geometry theory* T*, its semantics is incarnated by its associated topos*  $\mathcal{E}_T$ *.* 

### **Remarks:**

 $\bullet$  In particular, two theories  $\mathbb T$  and  $\mathbb T'$  are semantically equivalent if and only if

 $\mathcal{E}_{\mathbb{T}} \cong \mathcal{E}_{\mathbb{T}'}$ .

• A geometric theory  $\mathbb T$  is contradictory if and only if  $\mathcal{E}_{\mathbb{T}} = \emptyset$ 

### **A miracle of Topos Theory:**

The semantics of any first-order geometric theory  $\mathbb T$ 

is incarnated by a well-defined mathematical object  $\mathcal{E}_{\mathbb{T}}$ 

which is of topological nature and is amenable to computation.

### **Back from semantics to syntax:**

**Theorem.** – Any topos morphism 
$$
f : \mathcal{E}' \to \mathcal{E}
$$
 uniquely factorizes as  

$$
\mathcal{E}' \xrightarrow{\quad \text{``surjective''\quad \text{Im}(f) \xrightarrow{\quad \text{embedding}} \mathcal{E}.
$$

#### **Remarks:**

• As a consequence, there is a well-defined push-forward map

$$
f_*: \{\text{subtoposes } \mathcal{E}_1' \hookrightarrow \mathcal{E}'\} \to \{\text{subtoposes } \mathcal{E}_1 \hookrightarrow \mathcal{E}\},
$$

$$
(\mathcal{E}'_1 \hookrightarrow \mathcal{E}') \mapsto \operatorname{Im}(\mathcal{E}'_1 \hookrightarrow \mathcal{E}' \xrightarrow{f} \mathcal{E}).
$$

 $(\mathcal{E}_1' \hookrightarrow \mathcal{E}') \mapsto \text{Im}(\mathcal{E}_1' \hookrightarrow \mathcal{E}' -$ <br>• One can prove that there exists also a pull-back map

$$
f_* = f^{-1} : \{ \text{subtoposes } \mathcal{E}_1 \hookrightarrow \mathcal{E} \} \to \{ \text{subtopposes } \mathcal{E}_1' \hookrightarrow \mathcal{E}' \} (\mathcal{E}_1 \hookrightarrow \mathcal{E}) \mapsto (f^{-1}\mathcal{E}_1 \hookrightarrow \mathcal{E}')
$$

characterized by  $f_1'$ )  $\Leftrightarrow$   $f^{-1}\mathcal{E}_1 \supseteq \mathcal{E}_1'$ .

**Theorem (O. Caramello)**. – For any geometric theory  $\mathbb{T}$ , subtoposes  $\mathcal{E} \hookrightarrow \mathcal{E}_{\mathbb{T}}$ *correspond to "quotient" theories*  $\mathbb{T}'$  *derived from*  $\mathbb{T}$  *by adding extra axioms.* 

**Consequence:** For any model M of  $\mathbb T$  in a topos  $\mathcal E$ , corresponding to  $\mathcal E \stackrel{m}{\longrightarrow} \mathcal E_{\mathbb T},$ 

 ${\rm Im}(m)\hookrightarrow {\mathcal E}_{{\mathbb T}}$  corresponds to a <u>quotient theory</u>  ${\mathbb T}'$ 

which can be called a syntactic description of *M*.

# **How to represent natural families of data?**

• If we want to process natural families of data (ex: images), we first need to figure out

to which type of mathematics objects they should correspond.

• On the basis of classical practice,

the first idea would be to represent data as points of some spaces,

in particular as vectors of some (high dim.) linear spaces.

# **Objection:**

If we think in the more general terms of toposes,

points Pt  $\longrightarrow$   $\mathcal{E}_{\mathbb{T}}$  or  $\mathcal{E} \longrightarrow \mathcal{E}_{\mathbb{T}}$ 

correspond to "models" of geometric theories T.

They are of semantic nature, whereas stored data should be syntactic.

# **Proposed alternative:**

Represent natural families of data

as families of subtoposes of a given topos.

#### **Reasons for representing data as subtoposes:**

#### **First reason: syntactic expression**. –

*For any equivalence*  $\mathcal{E} \cong \mathcal{E}_T$ , the purely geometric notion of subtopos  $\mathcal{E}_1 \hookrightarrow \mathcal{E}$ *corresponds one-to-one to the purely syntactic notion of "quotient" theory*  $\mathbb{T}_1$  *of*  $\mathbb{T}_1$ *.* 

#### **Second reason: topological expression**. –

*The notion of subtopos has other expressions.*

*For any equivalence*  $\mathcal{E} \cong \widehat{\mathcal{C}}_J$  = *topos of " sheaves"* 

*on a small category* C *endowed with a " topology" J,*  $subtoposes \mathcal{E}_1 \hookrightarrow \mathcal{E}$  *correspond one-to-one to " topologies" J<sub>1</sub> on C which refine J.* 

#### **Third reason: amenability to geometric processing**. –

*Any "geometric" correspondence between toposes*



# **A possible general form of topos-theoretic deep learning:**



### **Fundamental questions:**

# **First question: the starting description language**

How to choose a starting description theory  $\mathbb{T}_0$ 

for the family of data under consideration?

### **Remark:**

If the data in such a natural family are to be represented as subtoposes of  $\mathcal{E}_{\mathbb{T}_0},$ 

 $\mathbb{T}_0$  should not be a "theory of this type of data"

but a "theory of viewpoints" on this type of data.

# **Second question: geometric language elaboration**

How to elaborate from an already constructed description language T*<sup>i</sup>*

a deeper (or better fitted for our objectives) description language  $\mathbb{T}_{i+1}$ 

related to  $\mathbb{T}_i$  through a double intertwined model structure:



# **Tying series of data through a joint description vocabulary:**

**Basic facts relating formalized languages and geometry**. – *(1) Any first-order geometric theory* T *consists in*  $a$  *vocabulary*  $\Sigma$  *and a family of axioms*  $\varphi(x_1^{A_1}, \dots, x_n^{A_n}) \vdash \psi(x_1^{A_1}, \dots, x_n^{A_n})$ *. (2) Any vocabulary* Σ *defines a "category" (*= *"mathematical country" consisting in: cities* + *itineraries* + *composition law of itineraries)* C<sup>Σ</sup> *whose "cities" and "itineraries" are "formulas" (*= *sentences in the vocabulary* Σ*). (3) This category*  $C_{\Sigma}$  *defines the topos*  $\mathcal{E}_{\Sigma} = \widetilde{C}_{\Sigma}$ . *(4) Choosing axioms to define* T *from* Σ *is equivalent to*  $\sqrt{ }$ *choosing a subtopos*  $\mathcal{E}_{\mathbb{T}} \hookrightarrow \mathcal{E}_{\Sigma} = \widehat{\mathcal{C}}_{\Sigma}$ , *choosing a "topology" J<sub>T</sub> on the "category"*  $C_{\Sigma}$ .

Suppose we want to introduce a starting description vocabulary  $\Sigma_0$ for a natural family of data (ex. images, plane configurations, algebraic equations,  $\cdots$ )  $\rightarrow$  Start with a family of concrete instances *i*  $\in$  *l*, each represented by a description vocabulary *V<sup>i</sup>* supplemented by conditions expressed in this vocabulary. <sup>→</sup> The fact that all *<sup>i</sup>* <sup>∈</sup> *<sup>I</sup>* belong to a natural family should allow to choose a "joint description vocabulary"  $\Sigma_0$  endowed with "naming functors"  $\mathcal{C}_{V_i} \longrightarrow \mathcal{C}_{\Sigma_0}$ ,  $\forall i \in I$ .

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# **A principle for inductive reasoning and syntactic learning:**

- Suppose we are given a series of concrete instances *i* ∈ *I* of a natural family of data.
- Suppose each instance *i* ∈ *I* is described by conditions expressed in a vocabulary *Vi*, which can equivalently be thought of as

$$
\int - a \underline{\text{topology}} J_i \text{ on } \mathcal{C}_{V_i},
$$

$$
- \quad \text{a} \; \overline{\text{subtops}} \quad \widehat{(\mathcal{C}_{V_i})}_{J_i} \hookrightarrow \widehat{\mathcal{C}_{V_i}} = \mathcal{E}_{V_i}.
$$

- Suppose the instances *i* ∈ *I* are related by
- a "joint description vocabulary"  $\Sigma_0$  and naming functors

$$
\mathcal{C}_{V_i} \longrightarrow \mathcal{C}_{\Sigma_0}, \quad i \in I,
$$

inducing <u>topos morphisms</u>  $\mathcal{E}_{V_i} = \widehat{\mathcal{C}_{V_i}} \xrightarrow{e_i} \widehat{\mathcal{C}_{\Sigma_0}}, i \in I$ .

#### **Principle of inductive reasoning:**

The starting description theory  $\mathbb{T}_0$  in the vocabulary  $\Sigma_0$ should be "as economical as possible" under the constraint that

for any 
$$
i \in I
$$
, the pull-back map  $e_i^{-1}$  by  $\widehat{C}_{V_i} \xrightarrow{e_i} \widehat{C}_{\Sigma_0}$ ,  
should verify  $e_i^{-1}(\mathcal{E}_{\mathbb{T}_0} \hookrightarrow \widehat{C}_{\Sigma_0}) \subseteq ((\widehat{C}_{V_i})_{J_i} \hookrightarrow \widehat{C}_{V_i})$ 

**Remark:** Pull-back maps always respect finite unions.

 $\sqrt{ }$ 

# **A principle for elaborating chains of "higher" description languages:**

Question: If a "description language"  $\mathbb{T}_i$  is already constructed, how to **derive** from  $\mathbb{T}_i$ "higher description languages"  $\mathbb{T}_{i+1}$  related to  $\mathbb{T}_i$  by geometric correspondences:



**Remark:** It may happen that *pi*, *q<sup>i</sup>* or both are equivalences.

Even that case can be very deep.

#### **Proposed process:**

- → Consider <u>different models</u> Γ<sub>*i*</sub> of  $\mathbb{T}_i$  in toposes  $\mathcal{E}_{\Gamma_i}$ , or equivalently different topos morphisms  $\mathcal{E}_{\Gamma_i} \xrightarrow{p_i} \mathcal{E}_{\mathbb{T}_i}$ .
- <sup>→</sup> Consider higher order constructions built from <sup>Γ</sup>*<sup>i</sup>* in E<sup>Γ</sup>*<sup>i</sup>*
	- (e.g. symmetry groups or, more generally, global invariants).
- $\rightarrow$  Recognize that these higher-order constructions are models of some other first-order geometric theory  $\mathbb{T}_{i+1}$ .
- $\rightarrow$  Choose the model  $\mathcal{E}_{\Gamma_i}$   $\stackrel{p_i}{\rightarrow}$   $\mathcal{E}_{\mathbb{T}_i}$  and the higher-order construction

so that the <u>induced correspondence</u>  $\mathcal{E}_{\mathbb{T}_i} \xleftarrow{\rho_i} \mathcal{E}_{\Gamma_i} \xrightarrow{q_i} \mathcal{E}_{\mathbb{T}_{i+1}}$  is <u>best fitted</u>.

### **Examples:**

# • **Descartes' equivalence:**

Start with the theory  $\mathbb T$  of affine planes.

Consider its "universal model"  $U$  in  $\mathcal{E}_{\mathbb{T}}$ .

Consider the associated groups of "translations" and "dilatations" of *U* and the associated field structure on lines endowed with two points.

→ This induces an equivalence  $\mathcal{E}_{\mathbb{T}} \cong \mathcal{E}_{\mathbb{T}'}$  if  $\mathbb{T}' = \underline{\text{theory of fields}}$ .

# • **Differential calculus:**

Start with a theory T of numbers. Consider a "complete" model  $\mathbb{R}: \mathcal{E}_{\mathbb{R}} \to \mathcal{E}_{\mathbb{T}}$ . Construct in  $\mathcal{E}_{\mathbb{R}}$  the inner space of functions  $\mathcal{H}$ *om*( $\mathbb{R}, \mathbb{R}$ ) and define subspaces of "differentiable" and "integrable" functions, yielding a topos morphism  $\mathcal{E}_{diff} \rightarrow \mathcal{E}_{\mathbb{R}}$ . Derive the algebraic rules of differential calculus (linearity, Leibnitz' rule, integration of derivatives, change of variables) defining a <u>theory</u>  $\mathbb{T}'$  endowed with a <u>model structure</u>  $\mathcal{E}_{\text{diff}} \longrightarrow \mathcal{E}_{\mathbb{T}'}$  .

### <span id="page-15-0"></span>**Examples:**

#### • **Galois' equivalence:**

Start with the theory  $\mathbb T$  of algebraic extensions of fields, endowed with  $\mathcal{E}_{\mathbb{T}} \to \mathcal{E}_{\mathbb{B}}$  for  $\mathbb{B} =$  theory of fields.

Consider any model  $k : Pt \to \mathcal{E}_\mathbb{B}$ , i.e. any field  $k$ , and the fiber product of toposes

 $\mathcal{E}_{\mathbb{T}_k} \longrightarrow \mathcal{E}_{\mathbb{T}}$ ľ. where  $\mathbb{T}_k =$  theory of algebraic extensions of  $k$ . ŗ Pt  $\xrightarrow{k} \mathcal{E}_{\mathbb{B}}$ 

Choose a separable closure *k* of *k*, considered as a point *k* : Pt →  $\varepsilon_{\mathbb{T}_k}$ . Consider the associated group *G* of symmetries of  $\overline{k}:$  Pt  $\rightarrow$   $\mathcal{E}_{\mathbb{T}_k}$ and the associated theory  $\mathbb{T}_G$  of principal *G*-actions, yielding a topos embedding  $\mathcal{E}_{\mathbb{T}_G} \hookrightarrow \mathcal{E}_{\mathbb{T}_k}$  .

• **An automatic system for analyzing time series inspired by O. Caramello's topos-theoretic ideas:** Starting with a theory  $\mathbb{T}_0$  of "viewpoints" on some type of time series, a software company has constructed a chain of theories  $\mathbb{T}_1, \cdots, \mathbb{T}_n$ where each T*<sup>i</sup>* is a theory of "higher order viewpoints" on T*i*−1. **Remark:** So far, the length of the chain is already  $n > 10$ .