# Categorical Semantics of Cyber-Physical Systems

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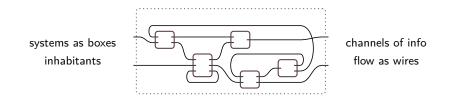
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### Systems Theory and Design

Idea: provide categorical framework for modeling and analysis of systems



Analyse the composite system using the analyses of the particular system components and their specific wired interconnection.

▶ System architecture and behavior in single model...

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## Outline

- 1. The monoidal category of labelled boxes and wiring diagrams
- 2. Systems as algebras for wiring diagrams
- 3. Interval sheaves
- 4. Abstract machines

### Labelled boxes and wiring diagrams

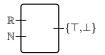
There is a category **WD** that consists of the following:

• objects are pairs of sets  $X = (X_{in}, X_{out})$ 



 $X_{\text{in}} - X_{\text{out}} - X_{\text{out}}$  think of X as a placeholder for systems, with input&output info values in  $X_{\text{in}}, X_{\text{out}}$ 

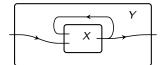
Example: an object  $(\mathbb{R} \times \mathbb{N}, \{\top, \bot\})$  is an empty box



A process that can later populate the box is a function

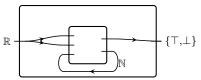
$$f(r,n) = \begin{cases} \top & \text{if } r = n \\ \bot & \text{if } r \neq n \end{cases}$$

• morphisms  $(X_{\text{in}}, X_{\text{out}}) \rightarrow (Y_{\text{in}}, Y_{\text{out}})$  are pairs of 'special' functions  $(X_{\text{out}} \times Y_{\text{in}} \xrightarrow{\phi_{\text{in}}} X_{\text{in}}, X_{\text{out}} \xrightarrow{\phi_{\text{out}}} Y_{\text{out}})$ 



think of  $\phi_{\rm in/out}$  expressing the flow of info through the ports

Example: the morphism  $(\mathbb{R}^2\times\mathbb{N},\{\top,\bot\}\times\mathbb{N})\to(\mathbb{R},\{\top,\bot\})$  as in



is described by the two functions

$$\begin{cases} \phi_{\mathrm{in}} \colon \overbrace{\{\top, \bot\} \times \mathbb{N}}^{X_{\mathrm{out}}} \times \overbrace{\mathbb{R}}^{Y_{\mathrm{in}}} \to \overbrace{\mathbb{R}}^{X_{\mathrm{in}}} & \text{by } \phi_{\mathrm{in}}(x, n, r) = (r, r, n) \\ \phi_{\mathrm{out}} \colon \underbrace{\{\top, \bot\} \times \mathbb{N}}_{X_{\mathrm{out}}} \to \underbrace{\{\top, \bot\}}_{Y_{\mathrm{out}}} & \text{by } \phi_{\mathrm{out}}(x, n) = x \end{cases}$$

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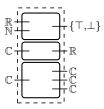
# Monoidal structure

• tensor product  $X \otimes Y = (X_{\mathrm{in}} imes Y_{\mathrm{in}}, X_{\mathrm{out}} imes Y_{\mathrm{out}})$ 



think of parallel execution of processes

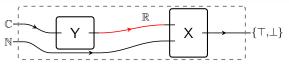
Example: for three boxes  $(\mathbb{R} \times \mathbb{N}, \{\top, \bot\})$ ,  $(\mathbb{C}, \mathbb{R})$  and  $(\mathbb{C}, \mathbb{C}^3)$ , their tensor is  $(\mathbb{R} \times \mathbb{N} \times \mathbb{C}^2, \{\top, \bot\} \times \mathbb{R} \times \mathbb{C}^3)$ 



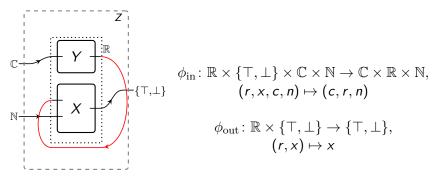
With appropriate composition law and identities, all axioms hold.

The category **WD** of labeled boxes and wiring diagrams is a monoidal category.

Any wiring interconnection can be expressed as a morphism in WD!



can be equivalently rearranged into



All functions are made up from projections, duplications and switches: **Set** could be replaced by *any* typing category C with finite products.

## The operad of wiring diagrams

Before, first 'aligned' all boxes to form their tensor and then computed the wiring; this relates to the *underlying operad* of any monoidal category.

A colored operad or multicategory  ${\mathcal P}$  consists of

- a set of objects (colors)
- for each (n + 1)-tuple of objects, a set of n-ary operations
  \$\mathcal{P}(c\_1, \ldots, c\_n; c)\$
- an identity operation  $\mathrm{id}_c \in \mathcal{P}(c; c)$
- a composition formula for nesting of operations

subject to associativity and unitality axioms.

▶ Every monoidal category  $\mathcal{V}$  gives rise to an operad  $\mathcal{O}(\mathcal{V})$  with same objects and *n*-ary operations  $\mathcal{O}(\mathcal{V})(c_1, \ldots, c_n; c) := \mathcal{V}(c_1 \otimes \ldots \otimes c_n, c)$ .

\* Pictures are nicer in the operad  $\mathcal{O}(WD)$  than WD!

Lax monoidal functors  $F : (\mathcal{V}, \otimes, I) \rightarrow (\mathbf{Cat}, \times, \mathbf{1})$  are called  $\mathcal{V}$ -algebras.

Fully faithful underlying operad functor  $SMonCat_{\ell} \xrightarrow{\mathcal{O}} SOpd$  induces

 $\mathcal{V}$ -Alg  $\cong$  SOpd( $\mathcal{OV}$ ,  $\mathcal{O}$ Cat) =: ( $\mathcal{OV}$ )-Alg.

$$\begin{array}{c} F: \mathbf{WD} \longrightarrow \mathbf{Cat} \\ X = (X_{\mathrm{in}}, X_{\mathrm{out}}) \longmapsto FX \\ \phi \downarrow \qquad \qquad \downarrow F\phi \\ Y = (Y_{\mathrm{in}}, Y_{\mathrm{out}}) \longmapsto FY \end{array}$$

subsystems category

composite system functor

gives *semantics* to boxes, *composite operation* to wiring diagrams and *parallelizing operation* to subsystems via  $FX \times FY \rightarrow F(X \otimes Y)$ 



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# Algebra of contracts

There is a lax monoidal functor  $\mathsf{Cntr}\colon \mathbf{WD}\to\mathbf{Cat}$  that

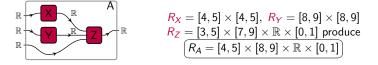
• to each box  $X_{in}$   $X \to X_{out}$  assigns category of *contracts*, i.e. relations

$$R \subseteq X_{\mathrm{in}} \times X_{\mathrm{out}}$$

• to each wiring diagram  $X_{\text{in}} \times X_{\text{out}}$  assigns formula  $\int_{1 \times X_{\text{out}}} \int_{1 \times X_{\text{out}}} X_{\text{in}} \times X_{\text{out}}$ 

that, given contracts on subsystems, produces contract on composite. • For each  $R_X \subseteq X_{in} \times X_{out}$  and  $R_Y \subseteq Y_{in} \times Y_{out}$  assigns contract

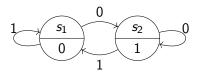
$$R_X imes R_Y \subseteq X_{ ext{in}} imes X_{ ext{out}} imes Y_{ ext{in}} imes Y_{ ext{out}} \cong X_{ ext{in}} imes Y_{ ext{in}} imes X_{ ext{out}} imes Y_{ ext{out}}$$



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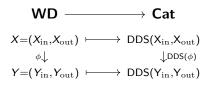
#### Algebra of discrete dynamical systems

Fix two sets  $X_{in}, X_{out}$ . A DDS (or *Moore machine*) consists of a set of states *S* along with two functions, upd:  $X_{in} \times S \rightarrow S$  that updates the state given some input, and rdt:  $S \rightarrow X_{out}$  that readouts an output value.



 $(S = \{s_1, s_2\}, upd, rdt)$  is the NOT machine

Model discrete systems as a **WD**-algebra:



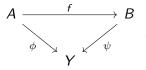
via  $(S, f^{upd}, f^{rdt}) \mapsto (S, g^{upd}, g^{rdt}),$   $g^{upd}(y, s) = f^{upd}(\phi_{in}(y, f^{rdt}(s)), s)$  $g^{rdt}(s) = \phi_{out}(f^{rdt}(s))$ 

### Systems theory in categorical terms

▶ The contracts algebra corresponds to the *requirements* part of systems analysis and design, which is fundamental for safety and control.

▶ Other **WD**-algebras, like the discrete or continuous dynamical systems, correspond to the *behavior* part, i.e. the physical specification of the process that inhabits the boxes.

▶ The categorical syntax of labeled boxes and wirings corresponds to the *architecture* part. Importantly, choosing subcomponents  $X_1, \ldots, X_n$  of a system Y as well as the way they are wired together (share information) is choosing a morphism  $\phi: X_1 \otimes \ldots \otimes X_n \rightarrow Y$  in **WD**, i.e. an object in the *slice category* **WD**/Y

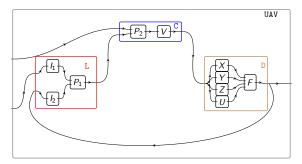


architectural choices and their relation

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#### Case study: UAV

 $\star$  Using the sub-algebra of *linear time-invariant* systems, can analyze the behavior of an unmanned aerial vehicle and also decompose it to a system architecture and constraint it via contracts.

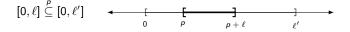


 $I_{1} \otimes I_{2} \otimes P_{1} \otimes P_{2} \otimes V \otimes X \otimes Y \otimes Z \otimes U \otimes F \xrightarrow{f \otimes g \otimes h} L \otimes C \otimes D \xrightarrow{k} UAV$ 

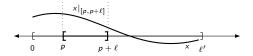
# Modeling Time: Categories of intervals

 $\mathbb{R}_{\geq 0}$  positive reals,  $\mathsf{Tr}_p : \mathbb{R}_{\geq 0} \to \mathbb{R}_{\geq 0}$  translation-by-*p*.

▶ Category Int of *continuous intervals* has objects  $\mathbb{R}_{\geq 0}$ , morphisms Int $(\ell, \ell') = \{ \mathsf{Tr}_p | p \in \mathbb{R}_{\geq 0} \text{ and } p \leq \ell' - \ell \}$ ; equivalently via image



▶ Category  $Int_N$  of *discrete intervals*,  $ob = \mathbb{N}$ ,  $n \xrightarrow{\mathsf{Tr}_p} n'$  by  $p \in \mathbb{N}$ . \* Int-presheaves: for A:  $Int^{op} \to Set$ , view section  $x \in A(\ell')$  & restriction  $A(\mathsf{Tr}_p)(x)$ 



#### Sheaves on intervals

For  $\ell \in Int$  and  $0 \le p \le \ell$ , the pairs  $p \xrightarrow{[0,p]} \ell$ ,  $(\ell - p) \xrightarrow{[p,\ell]} \ell$  form a cover for  $\ell$ . These generate a coverage for Int; similarly for Int<sub>N</sub>.

\* Int and  $Int_N$  are the toposes of *continuous* and *discrete interval* sheaves, i.e.  $Int_{(N)}$ -presheaves whose compatible sections glue.

Idea:  $Int_{(N)}$ -labeled boxes have ports carrying very general time-based signals, expressed as sheaves of 'all possible behaviors'.

#### Examples

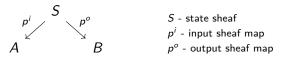
- $\widetilde{Int}_N \simeq \mathbf{Grph}$ , so every graph gives a discrete interval sheaf
- L: Set  $\rightarrow \widetilde{\operatorname{Int}}_N$  by  $L(X)(n) = X^{n+1}$ , non-empty X-lists sheaf
- **F**: Set  $\rightarrow$  Int by **F**(X)( $\ell$ ) = {f: [0,  $\ell$ ]  $\rightarrow$  X}, sheaf of functions
- $\mathsf{Ext}_{\epsilon} \colon \widetilde{\mathsf{Int}} \to \widetilde{\mathsf{Int}}$  by  $\mathsf{Ext}_{\epsilon}(A)(\ell) = A(\ell + \epsilon)$ ,  $\epsilon$ -extension sheaf

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#### Abstract machines

Purpose: define abstract systems in terms of **Int**-sheaves; perceive known dynamical systems as special cases; coherently interconnect arbitrary systems and study their behavior on common ground.

▶ A continuous machine with input & output  $A \& B \in \widetilde{Int}$  is

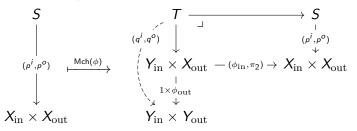


 $Mch(A, B) = Int/_{A \times B}$  the topos of continuous (A, B)-machines.

▶ For  $A, B \in \widetilde{Int}_N$ , discrete machines  $Mch_N(A, B) = \widetilde{Int}_N / A \times B$ .

Continuous machines form a  $WD_{Int}$ -algebra

 $\mathsf{Functor}\ \mathsf{Mch}\colon \mathbf{WD}_{\widetilde{\mathsf{Int}}}\to \mathbf{Cat}\ \mathsf{by}\ (X_{\mathrm{in}},X_{\mathrm{out}})\mapsto \mathsf{Mch}(\widetilde{\mathsf{X}_{\mathrm{in}}},\mathsf{X}_{\mathrm{out}})\ \mathsf{and}$ 



In fact, for any  $\ensuremath{\mathcal{C}}$  with pullbacks, this process is

$$\mathcal{C}/X_{\mathrm{in}} \times X_{\mathrm{out}} \xrightarrow{(\phi_{\mathrm{in}}, \pi_2)^*} \mathcal{C}/Y_{\mathrm{in}} \times X_{\mathrm{out}} \xrightarrow{(1 \times \phi_{\mathrm{out}})_!} \mathcal{C}/Y_{\mathrm{in}} \times Y_{\mathrm{out}}.$$

Finally, lax monoidal structure by taking products of spans:

$$(S \xrightarrow{(\rho^i, \rho^o)} X_{\mathrm{in}} \times X_{\mathrm{out}}, T \xrightarrow{(q^i, q^o)} Z_{\mathrm{in}} \times Z_{\mathrm{out}}) \mapsto (p^i \times q^i, p^o \times q^o)$$

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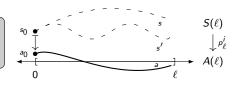
### Total and deterministic machines

Characteristics of interest: for initial state and input, the machine

- uniquely evolves or 'stays idle' view determinism
- always evolves ~~> totality

Continuous machines A + S + B are neither in general:

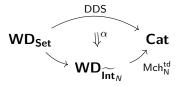
Starting in state germ  $s_0$ , for input *a* over  $\ell$ -interval, there may or may not be  $s_0$ -extension



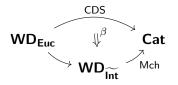
\* A *total* machine would have at least one extension, whereas a *deterministic* machine would have maximum one extension.

\* There exist subalgebras of  $Mch_{(N)}$ :  $WD_{int} \rightarrow Cat$  of total and deterministic machines, by imposing conditions on  $p^i$  and  $q^i$ .

► There are algebra maps from discrete dynamical systems



and from continuous dynamical systems



Algebra maps 'translate' between various processes; can then interconnect arbitrary systems & study them on common ground.

Thank you for your attention!



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