# From categorical systems theory to categorical cybernetics

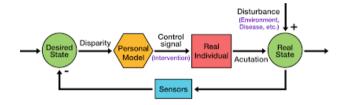
Matteo Capucci

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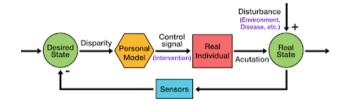
Virtual Double Categories Workshop

December 2nd, 2022

systems with control mechanisms and interactive feedback

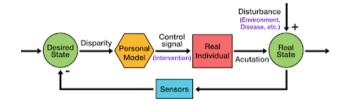


systems with control mechanisms and interactive feedback



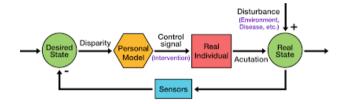
control theory

systems with control mechanisms and interactive feedback



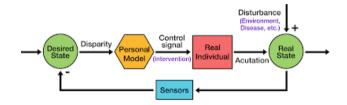
#### control theory, game theory

systems with control mechanisms and interactive feedback

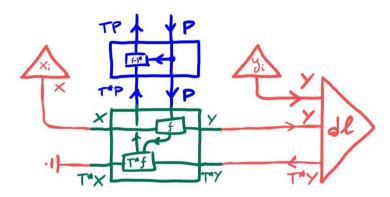


#### control theory, game theory, learning theory

systems with control mechanisms and interactive feedback

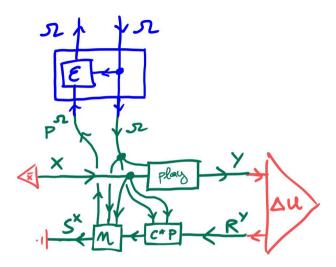


#### control theory, game theory, learning theory, etc...



A model trained by gradient-descent

(Fong, D. Spivak, and Tuyéras 2019; Cruttwell, Gavranović, Ghani, Wilson, and Zanasi 2021; Capucci 2022)



A strategic game

(Ghani, Hedges, Winschel, and Zahn 2018; Capucci, Gavranović, Hedges, and Rischel 2021; Capucci

But...

# What does it mean to 'study cybernetic systems'?

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#### Ontology

What 'is' a cybernetic system? What is it made of? How does it interact with other cybernetic systems? What is its interface? How do we describe it?

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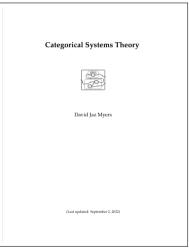
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#### Phenomenology

What does a cybernetic system 'do'? What can it be observed about it? How do observations of different parts relate to observations on the whole? When are two cybernetic systems observationally interchangeable?

A principled mathematical framework for the ontology and phenomenology of systems is given by categorical systems theory (CST)





CST is a principled and widely applicable paradigm for organizing a 'theory' of systems/processes. It encompasses any example I found in the literature so far:

1. Algebras for operads of string diagrams (D. I. Spivak 2013; Vagner, D. I. Spivak, and Lerman 2014; Libkind, Baas, Patterson, and Fairbanks 2021; Shapiro and D. I. Spivak 2022)

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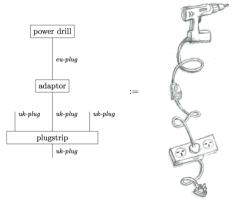
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- 3. Double categories of structured cospans (Fiadeiro and Schmitt 2007; Fong 2015; Baez and Courser 2020; Baez, Courser, and Vasilakopoulou 2022; Baez and Master 2020)
- Symmetric monoidal categories (Abramsky and Coecke 2004; Coecke and Paquette 2010; Coecke and Kissinger 2018)

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1. Processes compose like morphisms of a category



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- 1. Processes compose like morphisms of a category
- 2. Behaviours are relations/spans/matrices, and are (lax) functorially determined:

If  $(U, \alpha) : X \to Y$  is a circuit, an element of U is called a *state* of  $(U, \alpha)$ , and an element of X or Y is referred to as an *input* or an *output* for  $(U, \alpha)$  respectively.

Definition 3. The following data define the homomorphism

equilibrium : Circ  $\rightarrow$  Span.

(a) If X is an object of Circ, equilibrium(X) = X.
(b) If (U,α): X → Y is a circuit, let

 $W = \{(x, u) \in XU \mid p_U \cdot \alpha(x, u) = u\},\$ 

 $p: W \to X: (x, u) \mapsto x,$ 

and

$$q: W \to Y: (x, u) \mapsto p_Y \cdot \alpha(x, u).$$

From (Katis, Sabadini, and Walters 1997a)

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In Theorem 23, we show that the map sending P to  $\blacksquare P$  extends to a lax double functor  $\blacksquare: \bigcirc pen(Petri) \rightarrow \mathbb{R}el.$ 

From (Baez and Master 2020)

In fact, CST is inspired by characteristics shared across them all:

- 1. Processes compose like morphisms of a category
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**Definition 2.28.** Let  $F = (S, f^{rdt}, f^{upd})$  be an (A, B)-discrete system. For  $a \in A$  and  $b \in B$ , recall the set of (a, b)-steady states from Definition 2.4 and its count

 $\operatorname{Stst}(F)_{a,b} = #\{s \in S \mid f^{\operatorname{rdt}}(s) = b \text{ and } f^{\operatorname{upd}}(a,s) = s\}$ 

We can consider this as a matrix  $Stst(F) \in Mat(A, B)$ , which we call the *steady state matrix of F*.

From (D. I. Spivak 2015)

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2. There is a distinction between processes and systems.

Processes mediate interaction between systems, by acting on their interfaces:

$$\mathbf{Sys}: \mathbb{P}^\top \xrightarrow{\mathsf{unitary}\;\mathsf{lax}} \mathbb{C}\mathbf{at}$$

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#### Example

Dynamical systems (Rosen 1978) are endomorphisms  $T: S \to S$  on some objects of states, hopefully equipped with an observable  $X: S \to O$ . The notion of process between these systems is functions  $O \to O'$  that remap observations. Very different!

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All in **double** dimension

2. A glimpse of **categorical cybernetic systems theory**, and why we need the **triple** dimension

#### Notation & conventions

- 1. Double categories are weak by default, (double) functors are lax by default
- 2. For the rest I mostly follow Grandis (2019)
- 3. 'Loose' arrows are vertical (denoted:  $\rightarrow$ ), 'tight' arrows are horizontal (denoted:  $\rightarrow$ )



- 4. Set denotes the double category of spans in Set,
- 5. Cat denotes the **double category of** categories, functors, **profunctors** and natural transformations thereof.

I diverged from Myers (2021) on some notational and terminological choices.

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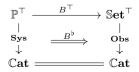
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$$\mathbf{Sys}: \mathbb{P}^{\top} \xrightarrow{\mathsf{unitary lax}} \mathbb{C}\mathbf{at}$$

3. Finally, behaviour is studied by describing maps into the span-ish 'observational theory':

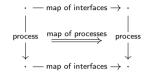


## **Process theories**

## Definition

A process theory is a double category with attitude where:

- 1. objects are boundaries or interfaces,
- 2. vertical morphisms are processes,
- 3. horizontal morphisms are maps of boundaries,
- 4. squares are maps of processes

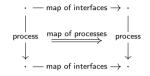


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Adding structure to the double category refines the kind of processes we are talking about, e.g.: **concurrent process theories** have a monoidal product with the attitude of spatial juxtaposition of processes,

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$$\begin{pmatrix} A^-\\A^+ \end{pmatrix} \stackrel{p^{\sharp}}{\underset{p}{\overset{\leftarrow}{\longleftrightarrow}}} \begin{pmatrix} B^-\\B^+ \end{pmatrix}$$

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3. maps of boundaries are charts:

$$\begin{pmatrix} A^-\\A^+ \end{pmatrix} \stackrel{h^\flat}{\underset{h}{\Longrightarrow}} \begin{pmatrix} C^-\\C^+ \end{pmatrix}$$

where

$$h: A^+ \to C^+, \qquad h^\flat: A^+ \times A^- \to C^-$$

3. maps of processes are 'commutative squares':

$$\begin{pmatrix} A^-\\A^+ \end{pmatrix} \xrightarrow{h^{\flat}} \begin{pmatrix} C^-\\C^+ \end{pmatrix}$$

$$p^{\sharp} \uparrow \downarrow p \qquad q^{\sharp} \uparrow \downarrow q$$

$$\begin{pmatrix} B^-\\B^+ \end{pmatrix} \xrightarrow{k^{\flat}} \begin{pmatrix} D^-\\D^+ \end{pmatrix}$$

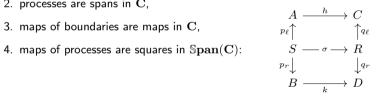
meaning for every  $a^+ \in A^+$  and  $b^- \in B^-$  we have

$$\begin{split} q(h(a^+)) &= k(p(a^+)), \\ h^\flat(a^+,p^\sharp(a^+,b^-)) &= q^\sharp(h(a^+),k^\flat(p(a^+),b^-)). \end{split}$$

## **Example: observational theories**

If C has pullbacks, Span(C) is the observational theory of C-processes where

- 1. boundaries are objects in C.
- 2. processes are spans in  $\mathbf{C}$ ,
- 3. maps of boundaries are maps in C.



This is an *observational theory*: processes are described by what we observe about their internal states.

# Systems vs processes

We have setup a way to talk about processes and maps thereof, but in practice we often care about specific processes, namely **stateful**/**one-sided** ones.

More generally, systems might be very different from the processes we use to plug them to!

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#### Example

Among (non-deterministic) lenses, stateful ones are known as (non-deterministic) Moore machines:

$$\begin{pmatrix} \text{update} \\ \text{observe} \end{pmatrix} : \begin{pmatrix} S \\ S \end{pmatrix} \leftrightarrows \begin{pmatrix} I \\ O \end{pmatrix}$$

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### Example

Among all spans, we can consider 'one-sided' ones as state spaces exposing some observables:

 $\text{observe}: S \to O$ 

Crucially, systems are

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 $\mathbf{Sys}: \mathbb{P}^\top \xrightarrow[]{\text{unitary lax}} \mathbb{C}\mathbf{at}^*$ 

\*More precisely, this is a right module of  $\mathbb{P}$ , considered as a (pseudo)monad in  $\mathbb{Span}(\mathbf{Cat})$ , since we can't really exchange loose and tight arrows (thanks to DJM for clarifying this).

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Again, one can consider more structure, e.g. **concurrent systems theories**, which are systems theories over concurrent process theories (monoidal dbl cats) given by lax monoidal indexings.

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3. maps of boundaries  $h : A \rightarrow C$  act profunctorially (and laxly!):

 $\mathbf{Sys}(h) : \mathbf{Sys}(A) \longrightarrow \mathbf{Sys}(C)$ 

and we think of Sys(h)(S, R) as the possible simulations of S : Sys(A) in R : Sys(C) mediated by the map h on their boundaries.

4. maps of processes

$$\begin{array}{ccc} A & \stackrel{h}{\longrightarrow} & C \\ \stackrel{p \downarrow}{\longleftarrow} & \stackrel{\sigma}{\Longrightarrow} & \stackrel{\downarrow}{\downarrow} q \\ B & \stackrel{k}{\longrightarrow} & D \end{array}$$

yield squares

$$\begin{array}{ccc} \mathbf{Sys}(A) & & \xrightarrow{\mathbf{Sys}(p)} & \mathbf{Sys}(B) \\ \mathbf{sys}(h) & & & & & \downarrow \\ \mathbf{Sys}(c) & & & & \downarrow \\ \mathbf{Sys}(C) & & & & \mathbf{Sys}(D) \end{array}$$

which extend a given simulation of systems along the given map of systems  $\sigma$ .

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update :  $S \to S$ 

in some category of spaces S (e.g. Smooth, Meas, ...)

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We can arrange ODS in a system theory, over a slightly trivial process theory,  $S^{\rightarrow}$ :

$$\begin{array}{ccc} O & \stackrel{h}{\longrightarrow} & O' \\ p \downarrow & & \downarrow^q \\ Q & \stackrel{}{\longrightarrow} & Q' \end{array}$$

Depending on the context, one might make vertical and horizontal maps different, e.g. vertical maps might be effectful while horizontal ones aren't.

Then

$$\mathbf{DynSys}: \mathbf{S}^{\rightarrow} \xrightarrow{\text{unitary lax}} \mathbb{C}\mathbf{at}$$
$$\mathbf{DynSys}(O) = \left\{ \begin{array}{c} S \xrightarrow{g} R \\ \text{update}_{\mathsf{S}} \downarrow & \downarrow \text{update}_{\mathsf{R}} \\ S \xrightarrow{g} R \\ \text{observe}_{\mathsf{S}} \downarrow & \downarrow \text{update}_{\mathsf{R}} \\ O == O \end{array} \right\}$$

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Given a process  $p: O \rightarrow Q$ , we define

$$\mathbf{DynSys}(p) : \mathbf{DynSys}(O) \longrightarrow \mathbf{DynSys}(Q)$$
$$(S, \mathrm{update}_{\mathsf{S}}, \mathrm{observes}) \longmapsto (S, \mathrm{update}_{\mathsf{S}}, \mathrm{observes} \, \mathring{,} \, p)$$

Given a map of boundaries  $h: O \rightarrow O'$ , we define a profunctor

$$\mathbf{DynSys}(h) : \mathbf{DynSys}(O)^{\mathsf{op}} \times \mathbf{DynSys}(O') \longrightarrow \mathbf{Set}$$

$$(\mathsf{S},\mathsf{R}) \longmapsto \left\{ \begin{array}{c} g: S \to R \\ g: S \to R \end{array} \middle| \begin{array}{c} S \xrightarrow{-g} R \\ update_{\mathsf{S}} \downarrow & \downarrow update_{\mathsf{R}} \\ S \xrightarrow{-g} R \\ observe_{\mathsf{S}} \downarrow & \downarrow update_{\mathsf{R}} \\ O \xrightarrow{-h} O' \end{array} \right\}$$

Finally, given a square  $\begin{array}{c} O \xrightarrow{h} O' \\ p \downarrow & \downarrow^q \end{array}$  we define a square  $Q \xrightarrow{k} Q'$  $\mathbf{DynSys}(O) \xrightarrow{\mathbf{DynSys}(p)} \mathbf{Dyn}$ 

$$\begin{array}{c} \mathbf{DynSys}(O) \xrightarrow{\mathbf{DynSys}(p)} \mathbf{DynSys}(Q) \\ \mathbf{DynSys}(h) & \xrightarrow{\mathbf{DynSys}(\Box)} & & \downarrow \mathbf{DynSys}(k) \\ \mathbf{DynSys}(O') \xrightarrow{\mathbf{DynSys}(q)} \mathbf{DynSys}(Q') \end{array}$$

'sending  $g: S \to R$  to itself', with the proof of commutativity got by stacking squares vertically:

Moore machines are (one possible notion of) system associated to the process theory Lens:

 $\mathbf{Moore}: \mathbb{L}\mathbf{ens}^\top \xrightarrow[]{\mathsf{unitary lax}} \mathbb{C}\mathbf{at}$ 

A Moore machine S :  $\mathbf{Moore} \begin{pmatrix} I \\ O \end{pmatrix}$  is an **open dynamical systems**:

 $update_{\mathsf{S}}: S \times I \longrightarrow S, observe_{\mathsf{S}}: S \longrightarrow O$ 

It's not just open towards the outside (observable), it's also open from the outside.

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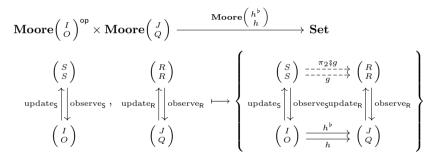
```
update_{\mathsf{S}}: S \times I \longrightarrow S, observe_{\mathsf{S}}: S \longrightarrow O
```

It's not just open **towards** the outside (*observable*), it's also open **from** the outside. Morphisms are maps that commute with the dynamics

$$\mathbf{Moore}\begin{pmatrix}I\\O\end{pmatrix} = \begin{cases} \begin{pmatrix}S\\S\end{pmatrix} \xrightarrow{\pi_2 \$g} & \begin{pmatrix}R\\R\end{pmatrix}\\ update_{S} \uparrow \downarrow observe_{S} update_{R} \uparrow \downarrow observe_{R}\\ \begin{pmatrix}I\\O\end{pmatrix} \xrightarrow{} & \begin{pmatrix}I\\O\end{pmatrix} \end{cases}$$

Given a lens  $\begin{pmatrix} p^{\sharp} \\ p \end{pmatrix}$  :  $\begin{pmatrix} I \\ O \end{pmatrix} \Rightarrow \begin{pmatrix} I' \\ O' \end{pmatrix}$  we get a functor:  $\mathbf{Sys}\begin{pmatrix} p^{\sharp}\\ p \end{pmatrix}: \mathbf{Sys}\begin{pmatrix} I\\ O \end{pmatrix} \longrightarrow \mathbf{Sys}\begin{pmatrix} I'\\ O' \end{pmatrix}$  $\begin{pmatrix} S \\ S \end{pmatrix} \qquad \begin{pmatrix} S \\ S \end{pmatrix}$  $\begin{pmatrix} I \\ O \end{pmatrix} \qquad \begin{pmatrix} I' \\ O' \end{pmatrix}$ 

Given a chart  $\begin{pmatrix} h^b \\ h \end{pmatrix}$  :  $\begin{pmatrix} I \\ O \end{pmatrix} \Rightarrow \begin{pmatrix} J \\ Q \end{pmatrix}$  we get a profunctor:



Finally, given a square

$$\begin{pmatrix} I \\ O \end{pmatrix} \xrightarrow{h^{\flat}} \begin{pmatrix} J \\ Q \end{pmatrix}$$

$$p^{\sharp} \uparrow \downarrow p \qquad q^{\sharp} \uparrow \downarrow q$$

$$\begin{pmatrix} I' \\ O' \end{pmatrix} \xrightarrow{k^{\flat}} \begin{pmatrix} J' \\ Q' \end{pmatrix}$$

we get a square in  $\mathbb{C}\mathbf{at}...$ 

$$\begin{split} \mathbf{Moore} \begin{pmatrix} I \\ O \end{pmatrix}^{\mathbf{Moore} \begin{pmatrix} p^{\sharp} \\ p \end{pmatrix}} \mathbf{Moore} \begin{pmatrix} I' \\ O' \end{pmatrix} \\ \mathbf{Moore} \begin{pmatrix} h^{\flat} \\ h \end{pmatrix} \downarrow \qquad \underbrace{\mathbf{Moore} (\Box)}_{\mathbf{Moore} (\Box)} \qquad \qquad \downarrow \mathbf{Moore} \begin{pmatrix} k^{\flat} \\ k \end{pmatrix} \\ \mathbf{Moore} \begin{pmatrix} J \\ Q \end{pmatrix}_{\mathbf{Moore} \begin{pmatrix} q^{\sharp} \\ q \end{pmatrix}} \mathbf{Moore} \begin{pmatrix} J' \\ Q' \end{pmatrix} \end{split}$$

...given by stacking squares:

### **Example: observational theory**

Any observational theory of processes  $\mathbb{S}\mathbf{pan}(\mathbf{C})$  supports a theory of observational systems

$$\mathbf{Obs}_{\mathbf{C}}: \mathbb{S}\mathbf{pan}(\mathbf{C})^{\top} \xrightarrow{\mathsf{unitary} \; \mathsf{lax}} \mathbb{C}\mathbf{at}$$

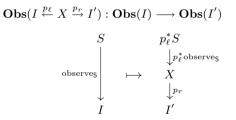
$$\mathbf{Obs_C}(I) = \left\{ \begin{array}{cc} S & \stackrel{h}{\longrightarrow} R \\ {}_{\mathrm{observe}_{\mathsf{S}} \bigcup} & {}_{\mathrm{observe}_{\mathsf{R}}} \\ I & = I \end{array} \right\}$$

In this theory, a system S over the interface  $I : \mathbf{C}$  is simply a state space  $S : \mathbf{C}$  together with an observation observes  $: S \to I$ .

One can see maps  $S \to I$  as spans  $S == S \to I$ , thereby fitting this example into a more general pattern of 'systems are processes with a special left boundary'

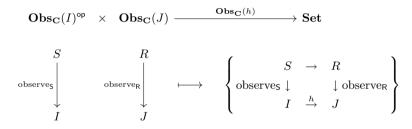
### **Example: observational theory**

Given a span  $I \stackrel{p_{\ell}}{\leftarrow} X \stackrel{p_{\tau}}{\rightarrow} I'$ , we can reindex by pull-push (span composition):



### **Example: observational theory**

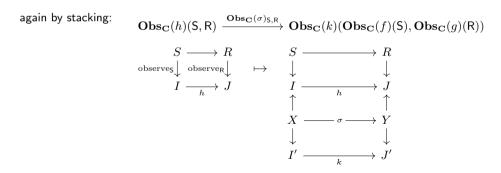
Given a map  $I \xrightarrow{h} J$ , we define a profunctor:



#### **Example:** observational theory

Finally, we have a map on squares that sends

$$\begin{array}{cccc} I & \stackrel{h}{\longrightarrow} J & \mathbf{Obs_{C}}(I) & \stackrel{\mathbf{Obs_{C}}(p)}{\longrightarrow} & \mathbf{Obs_{C}}(J) \\ & & & \uparrow^{q_{\ell}} & & \\ X & -\sigma \rightarrow Y & \longmapsto & \mathbf{Obs_{C}}(h) \downarrow & \stackrel{\mathbf{Obs_{C}}(\sigma)}{\longrightarrow} & \downarrow^{\mathbf{Obs_{C}}(k)} \\ & & & & \downarrow^{q_{r}} & & \\ & I' & \stackrel{k}{\longrightarrow} J' & \mathbf{Obs_{C}}(I') & \stackrel{\mathbf{Obs_{C}}(g)}{\longrightarrow} & \mathbf{Obs_{C}}(J') \end{array}$$



### **Example: observational theory**

Thus we have a systems theory:

$$\mathbf{Obs}_{\mathbf{C}}: \mathbb{S}\mathbf{pan}(\mathbf{C})^{\top} \xrightarrow{unitary \ lax} \mathbb{C}\mathbf{at}$$

In particular, we have

$$\mathbf{Obs_{Set}}: \mathbb{Set}^{ op} \xrightarrow{\mathsf{unitary lax}} \mathbb{Cat}$$

which on objects is defined as  $I \mapsto \mathbf{Set}/I \cong \mathbf{Set}^{I}$ .

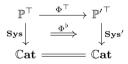
When we write **Obs**, this is what we mean.

### Morphisms of system theories

In category theory, we are interested in the way things map into each other...

#### Definition

A morphism of system theories  $\Phi : \mathbf{Sys} \to \mathbf{Sys}'$  is a vertical lax natural transformation:

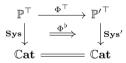


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Categorical system theory studies system theories

$$\mathbf{Sys}: \mathbb{P}^\top \xrightarrow{\mathsf{unitary}\;\mathsf{lax}} \mathbb{C}\mathbf{at}$$

through behaviours:

$$B: \mathbf{Sys} \longrightarrow \mathbf{Obs}$$

# **Corepresentable behaviours**

Construction

Given  $\mathbf{Sys}: \mathbb{P}^{\top} \to \mathbb{C}\mathbf{at}$ , and a system  $\mathsf{S}: \mathbf{Sys}(I)$ , there is a morphism:

### **Corepresentable behaviours**

Construction

Given  $\mathbf{Sys}: \mathbb{P}^{\top} \to \mathbb{C}\mathbf{at}$ , and a system  $\mathsf{S}: \mathbf{Sys}(I)$ , there is a morphism:

$$\begin{array}{c|c} \mathbb{P}^{\top} & \xrightarrow{\mathbb{P}_{h}(I,-)^{\top}} & \mathbb{Set}^{\top} \\ \mathbf{Sys} & & & \mathbb{Sys}(\mathbb{S},-) \\ \mathbb{Cat} & \longrightarrow & \mathbb{Cat} \end{array}$$

where, for a given  $J:\mathbb{P}$ ,

$$\mathbf{Sys}(\mathsf{S},-)_J:\mathbf{Sys}(J)\longrightarrow\mathbf{Set}^{\mathbb{P}_h(I,J)}$$

is a functor equivalently given as

$$\mathbf{Sys}(J) \times \mathbb{P}_h(I, J) \longrightarrow \mathbf{Set}$$
  
 $(\mathsf{T}, \quad I \xrightarrow{h} J) \quad \mapsto \quad \mathbf{Sys}(h)(\mathsf{S}, \mathsf{T})$ 

This picks all simulations of S in T mediated by the boundary map h.

#### **Example: fixpoints behaviours**

Let fix :  $\binom{1}{1} = \binom{1}{1}$  be the trivial Moore machine (only one states, no input output).

Then  $\mathbf{Moore}(\operatorname{fix}, -)$  is the **behaviour of fixpoints**: given another Moore machine  $\mathsf{T} : \begin{pmatrix} I \\ O \end{pmatrix}$ , and a chart  $\begin{pmatrix} i \\ o \end{pmatrix} : \begin{pmatrix} 1 \\ 1 \end{pmatrix} \Rightarrow \begin{pmatrix} I \\ O \end{pmatrix}$ , the set

$$\mathbf{Moore}\binom{i}{o}(\mathsf{fix},\mathsf{T}) = \left\{ t \in T \; \left| \begin{array}{c} \binom{1}{1} \xrightarrow{\pi_2 \mathfrak{fs}} \binom{T}{T} \\ | & | & p^{\sharp} \uparrow \downarrow^p \\ \binom{1}{1} \xrightarrow{i} \xrightarrow{i} \binom{T}{O} \end{array} \right\} = \{ t \in T \mid p(s) = o, \; p^{\sharp}(t,i) = t \}$$

is the set of fixpoints for input i (and giving output o).

#### **Example: fixpoint behaviours**

#### Hence: studying fixpoints of Moore machines amounts to studying

 $Moore(fix, -) : Moore \longrightarrow Obs$ 

In particular, we can automatically mint lots of compositional structure. For instance, we know for any lens  $\begin{pmatrix} f_f^{\sharp} \\ f \end{pmatrix} : \begin{pmatrix} I \\ O \end{pmatrix} \leftrightarrows \begin{pmatrix} J \\ Q \end{pmatrix}$  there is a natural map

$$\begin{array}{c|c} \mathbf{Moore} \begin{pmatrix} I \\ O \end{pmatrix} & \xrightarrow{\mathbf{Moore}(\mathsf{fix}, -)_I} & \mathbf{Set}^{O \times I} \\ \\ \mathbf{Moore} \begin{pmatrix} f^{\sharp} \\ f \end{pmatrix} \end{pmatrix} & \underset{\mathbf{Moore} \begin{pmatrix} f \\ Q \end{pmatrix} & \xrightarrow{\mathbf{Moore}(\mathsf{fix}, \begin{pmatrix} f^{\sharp} \\ f \end{pmatrix})} & \mathbf{Set}^{Q \times J} \end{array}$$

sending fixpoints of S :  $\mathbf{Moore}\begin{pmatrix} I\\O \end{pmatrix}$  to fixpoints of its extension  $\mathbf{Moore}\begin{pmatrix} f^{\sharp}\\f \end{pmatrix}$ (S). And one can prove in this case the map is iso! This recovers (D. I. Spivak 2015), and generalizes more (see (Myers 2021, Theorem 5.3.3.1)).

#### **Recap: categorical systems theory**

1. One starts by defining a process theory, i.e. a double category with attitude:

$$\mathbb{P} := \begin{cases} \cdot & -\text{map of interfaces} \rightarrow \cdot \\ | & | \\ \text{process} & \text{map of processes} & \text{process} \\ \downarrow & \longrightarrow & \downarrow \\ \cdot & -\text{map of interfaces} \rightarrow \cdot \end{cases}$$

2. Then processes are used to index systems, giving rise to doubly indexed categories of systems:

$$\mathbf{Sys}: \mathbb{P}^{\top} \xrightarrow{\text{unitary lax}} \mathbb{Cat}$$

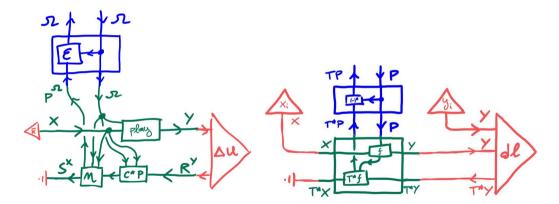
3. Finally, behaviour is studied by describing maps into the 'observational theory':

$$\begin{array}{c} \mathbb{P}^{\top} & \xrightarrow{B^{\top}} & \mathbb{S}\mathbf{et}^{\top} \\ \stackrel{|}{\operatorname{sys}} & \xrightarrow{B^{\flat}} & \stackrel{|}{\operatorname{obs}} \\ \stackrel{\downarrow}{\operatorname{v}} & \xrightarrow{} & \stackrel{\downarrow}{\operatorname{cat}} \end{array}$$

We get many of these just a corepresentable ones, i.e. maps of type  $\mathbf{Sys}(S, -)$ .

### **Motivation**

The systems of categorical system theory are varied and numerous, but they miss some interesting examples. In my work I mostly care about **games** and **learners**:



These (and others) are what I call cybernetic systems.

The conceptual foundation of 'categorical cybernetics', as advocated in Capucci, Gavranović, Hedges, and Rischel 2021 and in Smithe 2021 rests on two main pillars:

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The conceptual foundation of 'categorical cybernetics', as advocated in Capucci, Gavranović, Hedges, and Rischel 2021 and in Smithe 2021 rests on two main pillars:

1. The fact cybernetic systems are *mereologically* peculiar in having a distinctive boundary between '**controller**' and '**controlled**' subsystems;

 The fact cybernetic processes tend to organize in bicategorical structures, where the first dimension ignores the mereological distinction between controller and controllee, and the second dimension distinguishes the controller system—so that higher dimensions encode deeper control hierarchies;

The basic component of a bicategory of cybernetic processes is a globular 2-cell:



The 'cybernetic' interpretation of such a globe is that I and J denote an interface, f and g are controllable processes between the given interfaces, and v 'reduces' the controllability of g to that of f, being itself a dynamical process.

Their composition algebra also checks out: **vertical composition of globular cells models sequential composition of controls**, whereas horizontal composition models the 'parallel' composition of controls arising from the sequential composition of the processes they control.

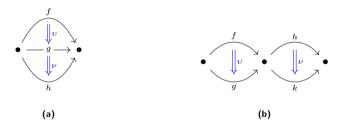
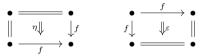


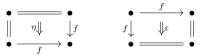
Figure: (a) sequential composition of controls, (b) parallel composition of controls.

With little effort, we can concert controllable and simple processes in the same structure. We claim the structure of controllable processes is that a of a **company** a double category where every tight arrow has a companion.



Idea: simple processes are trivially controllable processes, so 'appear both tightly and loosely'.

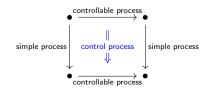
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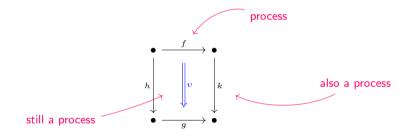
Idea: simple processes are trivially controllable processes, so 'appear both tightly and loosely'.

#### Definition

A cybernetic company is a a company with attitude whose objects are interfaces, loose arrows are controllable processes, tight arrows are simple processes, and squares are control processes:



Hence a company could be a good candidate for an objective definition of cybernetic process theory, except we lack maps of interfaces and of processes which are not themselves processes.



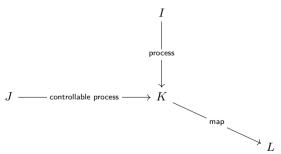
Thus we are forced to go 3D!

# Cybernetic process theories

Definition

A cybernetic process theory is a triple category with attitude  $\mathfrak P$  where

- 1. objects are **boundaries**/interfaces,
- 2. transversal 2-cells are maps of boundaries,
- 3. vertical 1-cells are processes,
- 4. horizontal 1-cells are controllable processes,

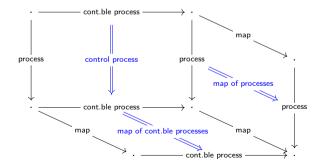


# Cybernetic process theories

Definition

A cybernetic process theory is a triple category with attitude  $\mathfrak P$  where

- 1. frontal 2-cells are control processes (and form a company),
- 2. vertical 2-cells are maps of processes,
- 3. horizontal 2-cells are maps of controllable processes

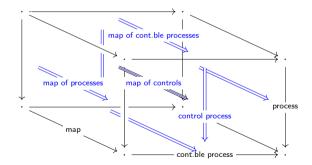


# **Cybernetic process theories**

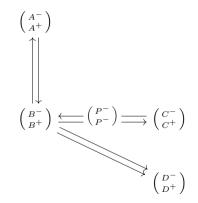
### Definition

A cybernetic process theory is a triple category with attitude  $\mathfrak P$  where

1. cubes are maps of control processes

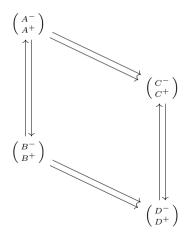


One can promote the process theory of lenses to a cybernetic theory  $\mathbb{P}ara(\mathbb{L}ens)^1$ , with parametric lenses in the role of controllable processes:

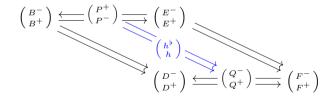


<sup>&</sup>lt;sup>1</sup>This notation is actually sound: there's a Para construction that yields this triple category

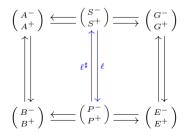
Vertical 2-cells are the same kind we encountered before ('commutative squares'):



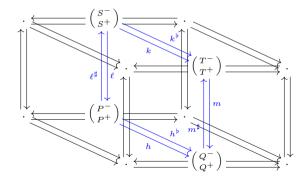
Horizontal 2-cells are still of the same kind, but there's an extra chart going between the parameters of the parametric lenses:



Basic 2-cells are commutative squares of parametric lenses:

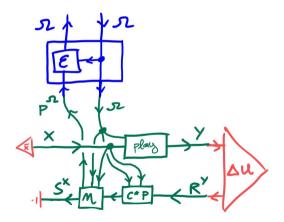


A cube is an arrangement of faces such that the blue parts form a square in  $\mathbb{L}ens$ :



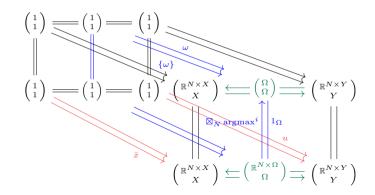
### Example: Nash equilibria

**Categorical game theory** (Capucci 2022; Capucci, Gavranović, Hedges, and Rischel 2021; Ghani, Hedges, Winschel, and Zahn 2018) is nowadays based on the idea games are parametric lenses, controlled by players.



### Example: Nash equilibria

**Categorical game theory** is nowadays based on the idea games are parametric lenses, controlled by players. In the same way fixpoints of Moore machines are maps (squares) from fix into them, one can show **Nash equilibria** of games are maps (cubes) from fix into them:



Here  $u: Y \to \mathbb{R}^N$  is a payoff function,  $\bar{x}$  an initial state, and  $\bar{\omega}$  a strategy profile.

### **Towards behavioural cybernetics**

We would like to recover the compositional formulae for Nash equilibria as functoriality of some corepresentable behaviour " $\mathbf{Plrs}(\mathsf{fix}, -)$ ", whatever this means.

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This would require to come up with the same ingredients we've used for open dynamical systems:

- 1. A notion of cybernetic system theory over a given cybernetic process theory
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It takes time to unpack all of these, so unfortunately I'm only going to be able to tell you about (1)

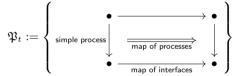
# Cybernetic system theories

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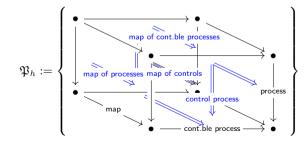
1. A **simple part**, given by the double category of interfaces, maps theoreof, simple processes and maps thereof.



# Cybernetic system theories

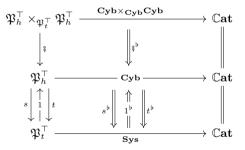
The crucial idea in the definition of cybernetic system theory is that a cybernetic process theory  $\mathfrak{P}$  can be decomposed into two process theories:

- 1. A **simple part**, given by the double category of interfaces, maps theoreof, simple processes and maps thereof.
- 2. A **cybernetic part**, whose objects are cybernetic processes, vertical 1-cells are control processes, horizontal 1-cells are maps of controllable processes, and squares are maps of control processes.



### Cybernetic system theory

This suggests one can define a cybernetic system theory by putting together a system theory Sys on  $\mathfrak{P}_t$  and a system theory Cyb on  $\mathfrak{P}_h$ :



One can show that  $\mathbf{Cyb}$  and  $\mathbf{Sys}$  arrange to yield a triple functor

$$\mathbf{CybSys}: \mathfrak{P}^\top \xrightarrow{\mathsf{unitary \, lax-lax}} \mathbb{Span}(\mathbb{C}\mathbf{at})$$

where  $(-)^{\top}$  exchanges vertical and transversal 1-cells.

Thus, together with  $s^{\flat}$  and  $t^{\flat}$ , Cyb assigns a span of functors to each controllable process:

Idea: the category Cyb picks out, for a given controllable process  $I \xrightarrow{p} J$ , is a category control system U together with simple systems S 'closing off' p. This makes sense: a cybernetic system is a controllable system coupled to a control system.

$$I \xrightarrow{p} J \quad \longmapsto \quad \mathbf{Sys}(I) \xleftarrow{s_p^\flat} \mathbf{Cyb}(I \xrightarrow{p} J) \xrightarrow{t_p^\flat} \mathbf{Sys}(J)$$

The triple functor  $\mathfrak{P}^{\top} \xrightarrow{unitary \ lax} \mathbb{S}\mathbf{pan}(\mathbb{C}\mathbf{at})...$ 

1. ...associates a category to every controllable process, which are reindexed functorially by control processes and profunctorially by maps of controllable processes,

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- 2. ...gives each cybernetic system a source and a target simple system:

$$\begin{split} s^{\flat}_{I \xrightarrow{p} J} &: \mathbf{Cyb}(I \xrightarrow{p} J) \to \mathbf{Sys}(I), \\ t^{\flat}_{I \xrightarrow{p} J} &: \mathbf{Cyb}(I \xrightarrow{p} J) \to \mathbf{Sys}(J) \end{split}$$

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$$1_I^\flat:\mathbf{Sys}(I)\longrightarrow\mathbf{Cyb}(I==I)$$

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4. ...features a compatibility structure with sequential composition of cybernetic processes, given by

$$\stackrel{\mathfrak{s}^{\flat}}{\underset{J \xrightarrow{q} K}{\overset{p}{\to} K}} : \mathbf{Cyb}(I \xrightarrow{p} J) \times_{\mathbf{Sys}(J)} \mathbf{Cyb}(J \xrightarrow{q} K) \longrightarrow \mathbf{Cyb}(I \xrightarrow{p} J \xrightarrow{q} K)$$

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First in line are applications to game theory, where it can be used to mint compositional structure for equilibrium concepts.

Secondly, how can this framework be useful for other cybernetic systems theories? Can it be used to frutifully map between learning & games? Can we use it to prove theorems across different kinds of systems? (e.g. good regulator theorems/internal model principles/FEP).

# Thanks for your attention!

**Questions?** 

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