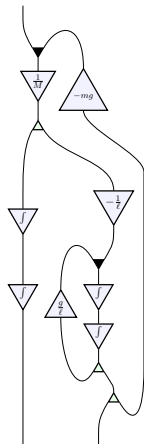
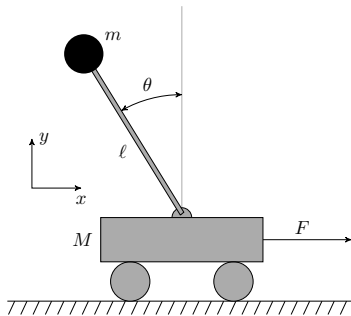


# A PROP model for controllability and observability in linear time-invariant signal flow diagrams with feedback

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Fullerton, CA  
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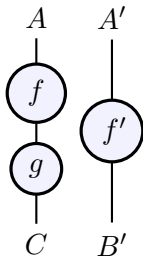
These signal flow diagrams look a lot like the string diagrams of morphisms in a PROP, so we will think of them as such. But what is a PROP? What is a string diagram?

## PROPs

A **PROP** is a strict symmetric monoidal category with one object that generates all other objects by  $n$ -fold tensoring.

**String diagrams** depict morphisms in monoidal categories in a “two-dimensional” way:

Let  $f: A \rightarrow B$ ,  $f': A' \rightarrow B'$ , and  $g: B \rightarrow C$ . Then  $(g \circ f) \otimes f'$  is



We will be interested in three PROPs here:

- $\mathbf{FinVect}$ , equivalent to the category of finite-dimensional vector spaces and linear maps

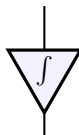
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- $\mathbf{FinRel}$ , equivalent to the category of finite-dimensional vector spaces and linear *relations*

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- $\mathbf{FinVect}$ , equivalent to the category of finite-dimensional vector spaces and linear maps
- $\mathbf{FinRel}$ , equivalent to the category of finite-dimensional vector spaces and linear *relations*
- $\mathbf{SigFlow}$ , equivalent to  $\mathbf{FinRel}$  together with one extra “free” morphism from the base field to itself.

This extra morphism will be depicted



A **linear relation**  $F: U \rightarrow V$  from a vector space  $U$  to a vector space  $V$  is a linear subspace  $F \subseteq U \oplus V$ .

When we compose linear relations  $F: U \rightarrow V$  and  $G: V \rightarrow W$ , we get a linear relation  $G \circ F: U \rightarrow W$ :

$$G \circ F = \{(u, w): \exists v \in V \quad (u, v) \in F \text{ and } (v, w) \in G\}.$$



A linear map  $\phi: U \rightarrow V$  gives a linear relation  $F: U \rightrightarrows V$ , namely the graph of that map:

$$F = \{(u, \phi(u)) : u \in U\}.$$

In this way, composing linear maps is a special case of composing linear relations.

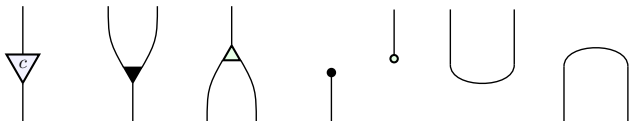
$\mathbf{FinVect}$  is a subPROP of  $\mathbf{FinRel}$ .

## Lemma (Baez, E.)

The category  $\text{FinRel}$ , with

- finite dimensional vector spaces over  $k$  as objects,
- linear relations as morphisms,

is a symmetric monoidal category with  $\oplus$  as its tensor product.  $\text{FinRel}$  is generated as a symmetric monoidal category by one object,  $k$ , together with the morphisms



where  $c \in k$ .

Two systems of equations:

- Differential:

$$\dot{x} = Ax + Bu$$

- Linear:

$$y = Cx + Du$$

$u$  is the input vector ( $\in \mathbb{R}^m$ )

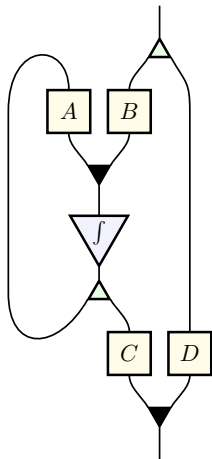
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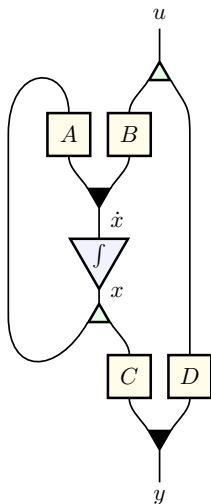
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Control engineers are often concerned with whether a system can be driven to a desired state using the inputs and whether the state can be determined from the system's outputs. These are the “dual” concepts of *controllability* and *observability*.

# Controllability

Given our matrix equations

$$\dot{x} = Ax + Bu$$

and

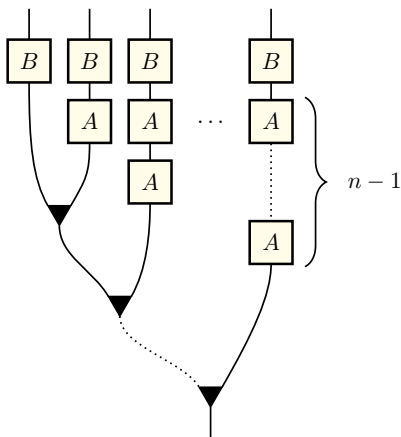
$$y = Cx + Du,$$

controllability is equivalent to the following matrix having full (row) rank:

$$\begin{bmatrix} B & AB & A^2B & \cdots & A^{n-1}B \end{bmatrix}.$$

## Controllability

The equivalent description using signal flow diagrams says

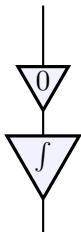


is an onto map in  $\text{FinVect}$ .



## An example

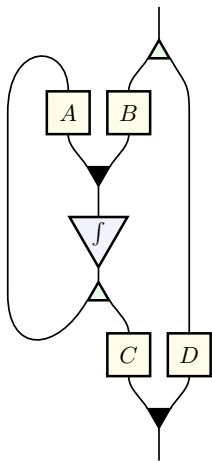
The signal flow diagram





is not controllable, since the state vector cannot be influenced at all by the input.

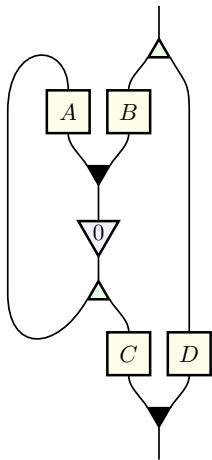
Given an arbitrary signal flow diagram,  
can we find  $A$ ,  $B$ ,  $C$ , and  $D$ ?

D



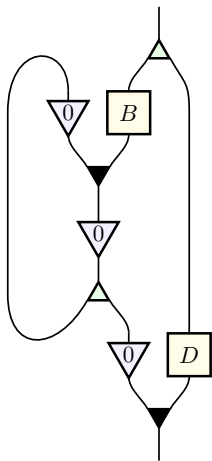
Replace  with 

D



$C \circ 0$  and  $A \circ 0$  are zero, so  $A$  and  $C$  add nothing.

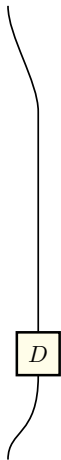
D



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$B$  is discarded when it gets multiplied by zero, and all that's left is a single path from input through  $D$  to output.

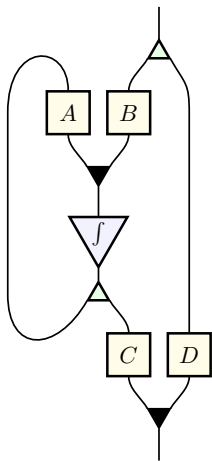
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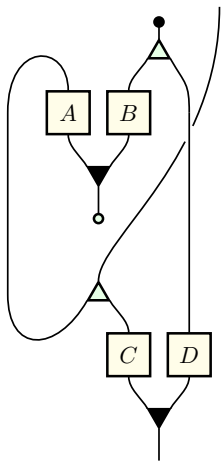



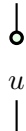
Replace  $f$  with  $u$

and



$u$  with  $\bullet$

C



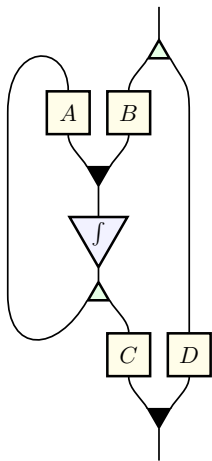
Replace  with 



and

 with 





B

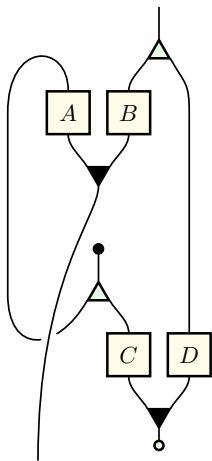




Replace  with 

and



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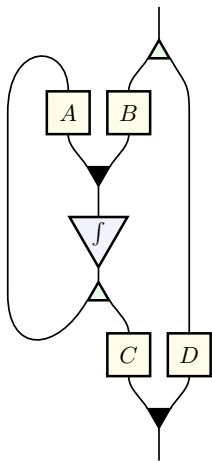


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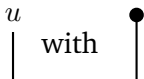
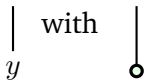
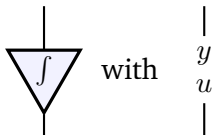
and

 with 

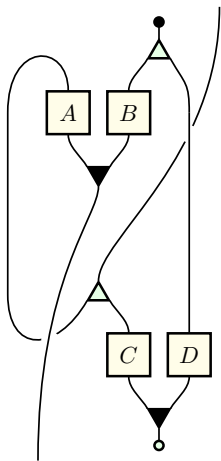
A



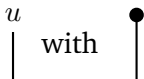
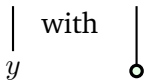
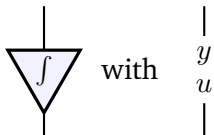
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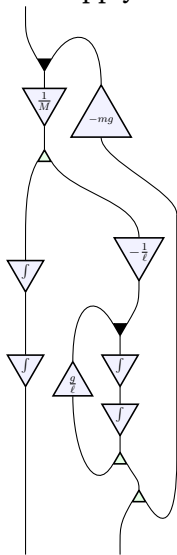


Replace:



## Example: Inverted pendulum

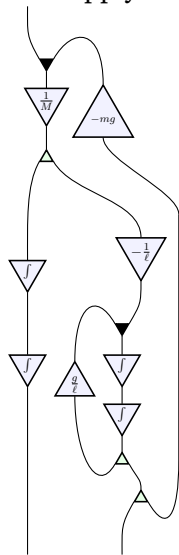
Let's apply this to the inverted pendulum:





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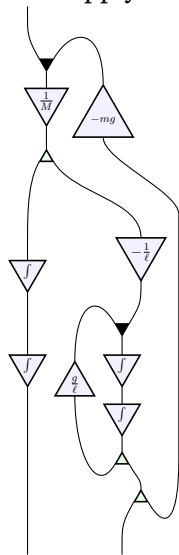
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$$D = \begin{array}{c} | \\ \circ \\ | \\ \bullet \\ | \\ \bullet \\ | \end{array}$$

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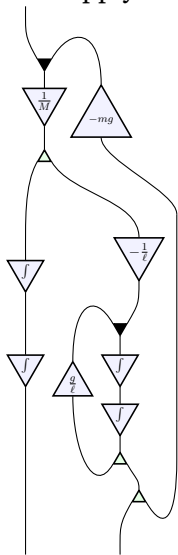


$$C = \begin{array}{c} | \\ \circ \\ | \end{array} \quad \begin{array}{c} | \\ | \\ | \end{array} \quad \begin{array}{c} | \\ \circ \\ | \end{array} \quad \begin{array}{c} | \\ | \\ | \end{array}$$

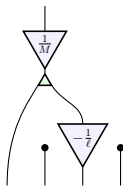


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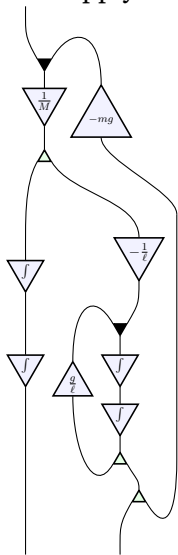


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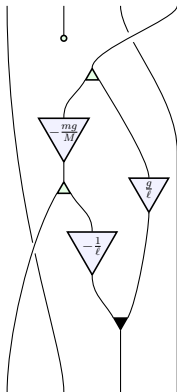


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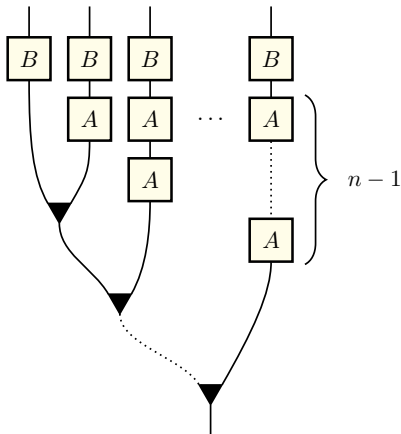
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There is no reason why this process has to give us linear maps! A more general signal flow diagram will have linear relations for  $A, B, C, D$ . This leads to the following generalization.

## Controllability, generalized

A signal flow diagram, decomposed into relations  $A, B, C, D$ , is controllable if



is an epimorphism in  $\text{FinRel}$ .

# Observability

Given our matrix equations

$$\dot{x} = Ax + Bu$$

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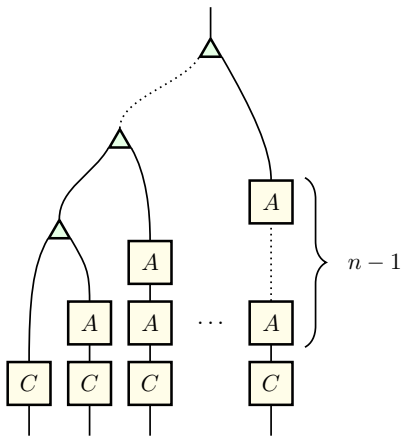
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## Observability

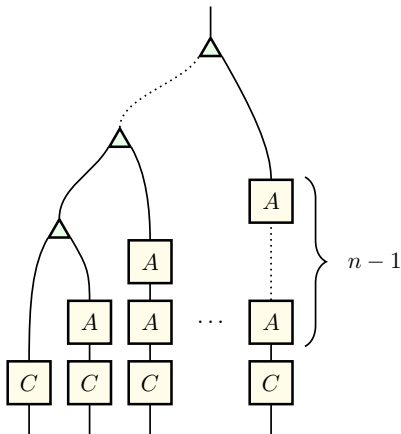
The equivalent description using signal flow diagrams says



is a one-to-one map in  $\text{FinVect}$

## Observability, generalized

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is a monomorphism in  $\mathbf{FinRel}$



## “Duality”

The “duality” between controllability and observability, matrix version:

- Transpose all matrices  $A, B, C, D$
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This color swap means the dual of any linear map will still be a linear map.

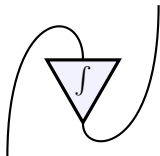
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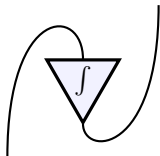
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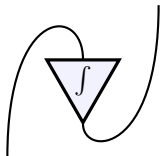


Compare and contrast the state-space approach here with the behavioral approach.

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Compare and contrast the state-space approach here with the behavioral approach.

Consider other control theory topics, such as stability.

Thank you!



## References

For more on “bizarro” duality, check out Paweł Sobociński’s blog, <http://graphicallinearalgebra.net>

For more on  $\mathbf{FinRel}$  and  $\mathbf{FinVect}$ , check out my article with John Baez, *Categories in control*