



OPEN DYNAMICAL SYSTEMS

THEIR AIMS and THEIR ORIGINS

Jan C. Willems
K.U. Leuven, Belgium

VII Antonio Ruberti Lecture

Rome, May 28, 2007

Antonio Ruberti



Today's area: **System theory & control**

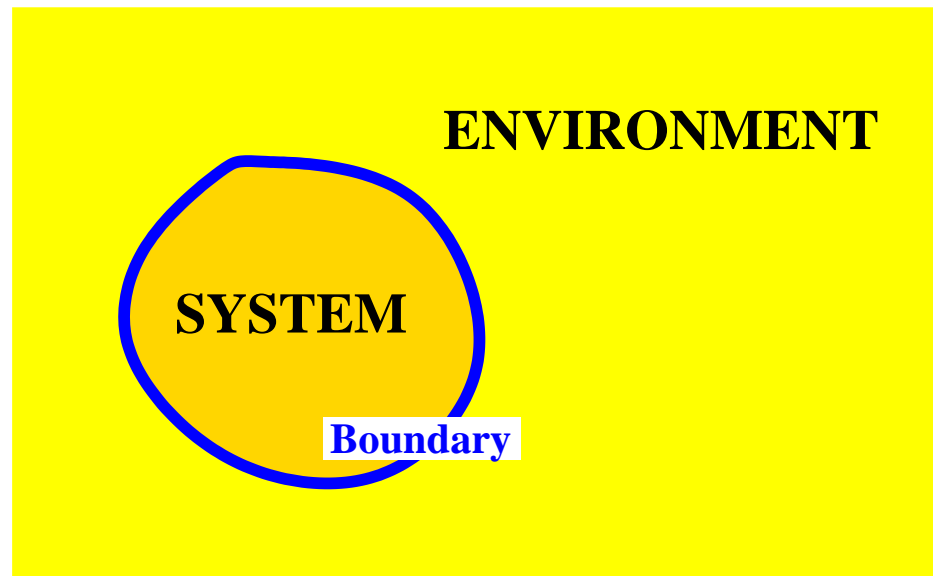
Open and Connected

The central tenets of the field of systems and control:

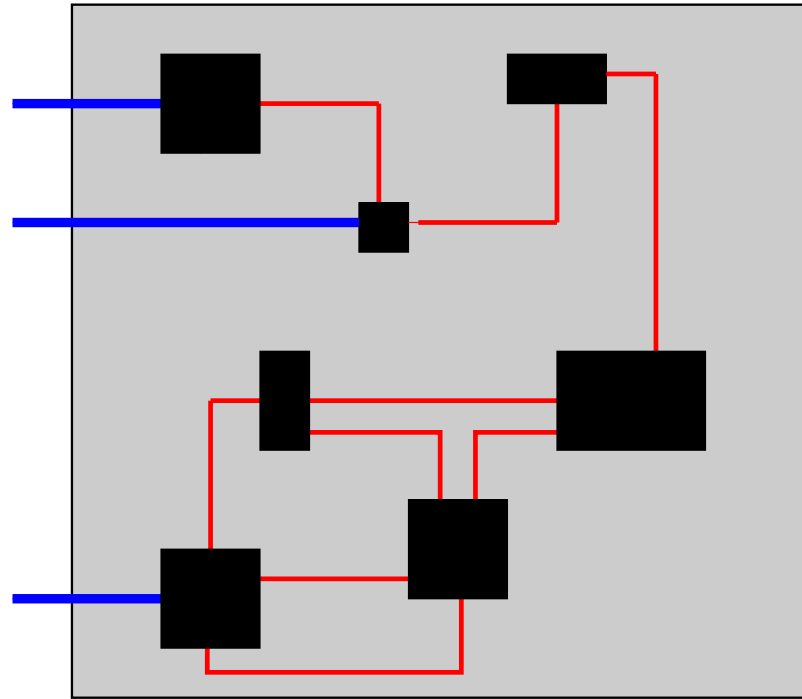
(Typical, generic) systems are **open** and an **interconnection** of subsystems.

Synthesis of systems consists of **interconnecting** subsystems

Open



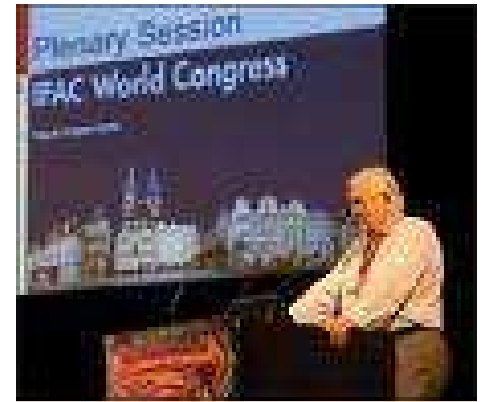
Connected



Architecture with subsystems

Theme

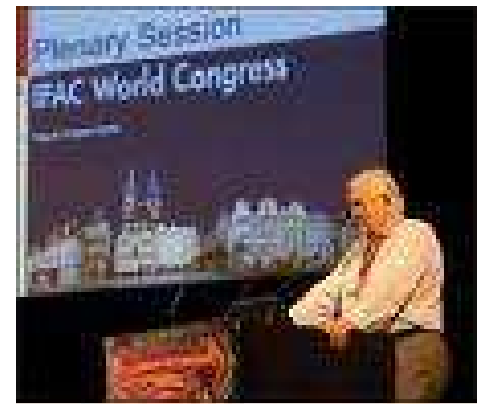
1. **Get the physics right**
2. **The rest is mathematics**



**R.E. Kalman, Opening lecture
IFAC World Congress
Prague, July 4, 2005**

Theme

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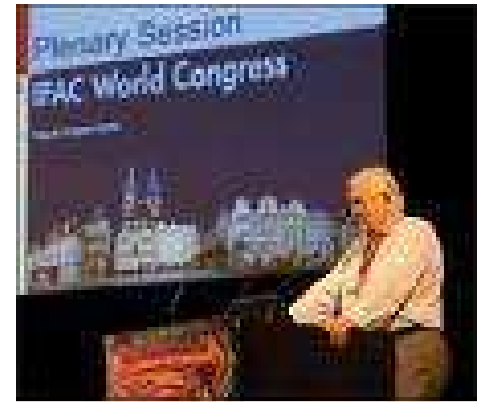


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Prima la fisica, poi la matematica

Theme

1. **Get the physics right**
2. **The rest is mathematics**



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**Mathematical analysis, simulation, prediction, work well
only if 'axiomatics' is sound, faithful translation of 'reality'...**

How it all began ...



How, for heaven's sake, does it move?

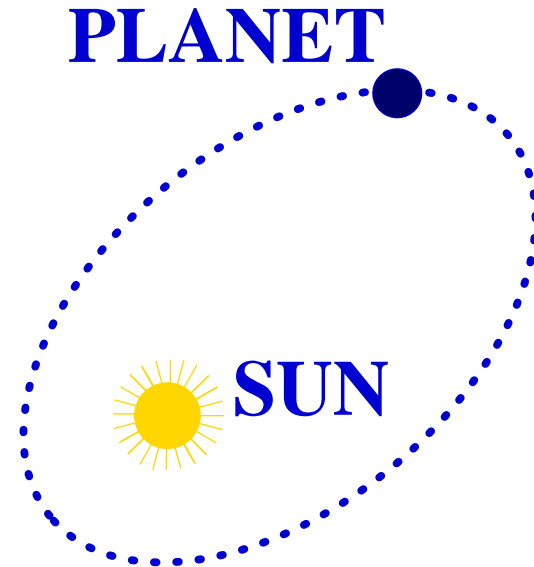
Kepler's laws



Johannes Kepler (1571-1630)

Kepler's laws:

**Ellipse, sun in focus;
= areas in = times;
(period)² \cong (diameter)³**



The equation of the planet

Consequence:

acceleration = function of position and velocity

$$\frac{d^2}{dt^2}w(t) = A\left(w(t), \frac{d}{dt}w(t)\right)$$

~> via **calculus** and **calculation**

$$\frac{d^2}{dt^2}w(t) + \frac{1}{|w(t)|^2} = 0$$



Isaac Newton (1643-1727)

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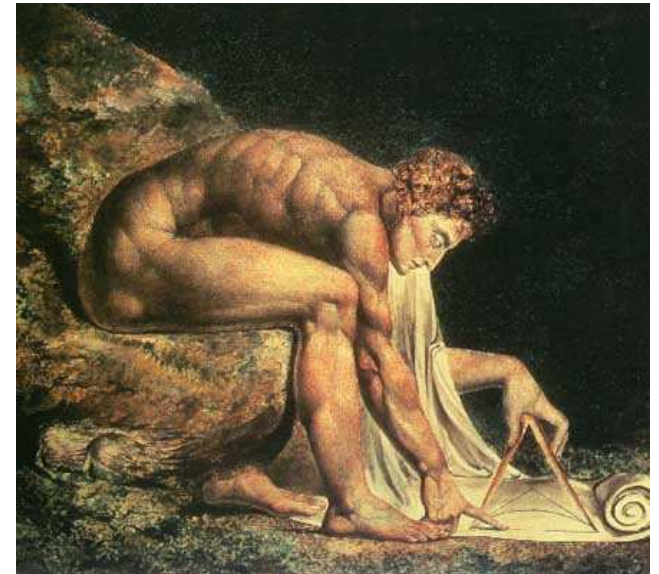
Isaac Newton (1643-1727)

Newton's laws

2-nd law $F'(t) = m \frac{d^2}{dt^2} w(t)$

gravity $F''(t) = m \frac{1_{w(t)}}{|w(t)|^2}$

3-rd law $F'(t) + F''(t) = 0$



⇓

$$\frac{d^2}{dt^2} w(t) + \frac{1_{w(t)}}{|w(t)|^2} = 0$$

The paradigm of *closed* systems

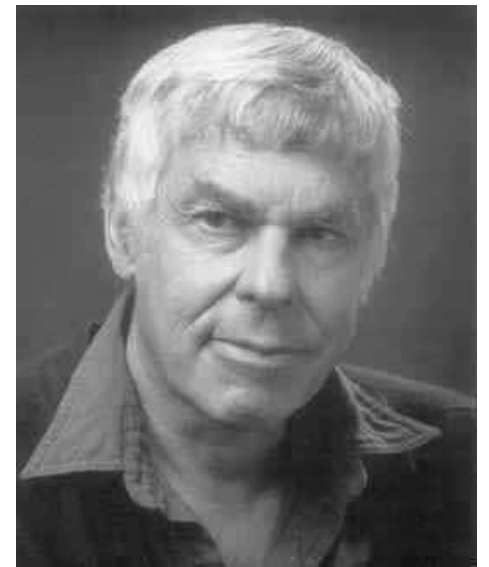
'Axiomatization'



Henri Poincaré (1854-1912)



George Birkhoff (1884-1944)



Stephen Smale (1930-)

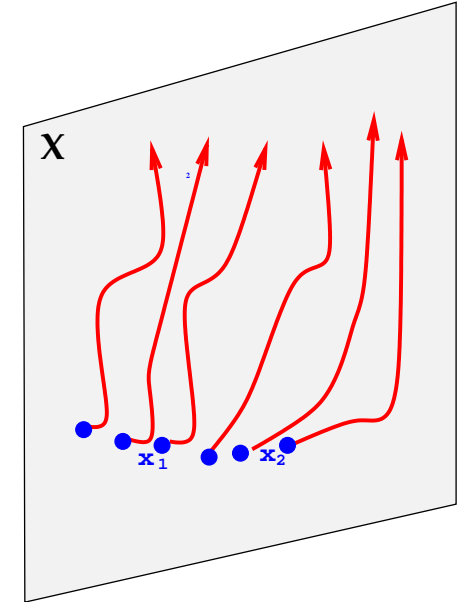
'Axiomatization'

A *dynamical system* is defined by

a **state space** X and

a **state transition function**

$\phi(t, \mathbf{x}) =$ state at time t starting from state \mathbf{x}



Dynamics = a set of variables that evolves **autonomously** in time.

This framework of **closed** systems

is **universally** used for dynamics

in mathematics and physics

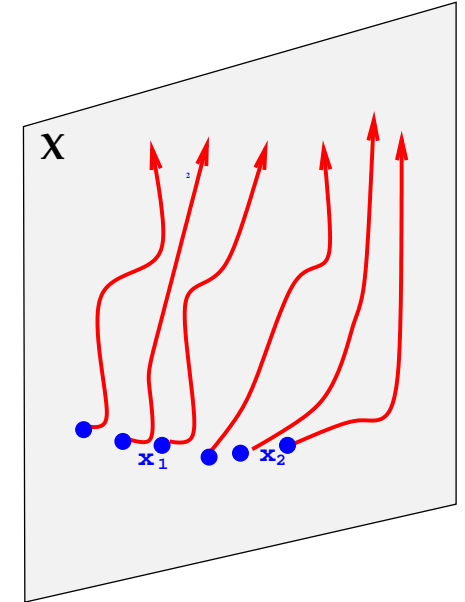
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Simulation scenario

= set initial conditions, run model

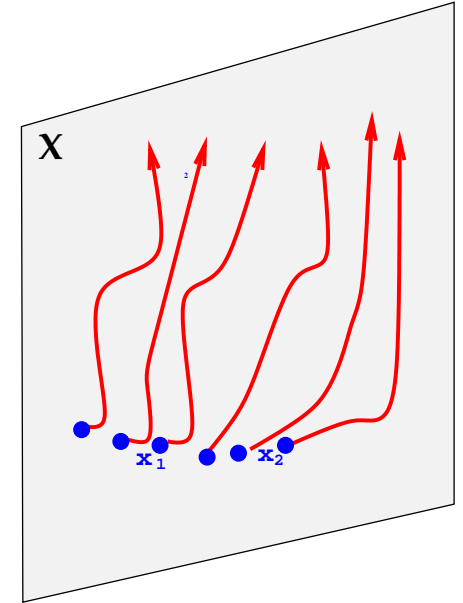
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How could they forget Newton's 2nd law,
about Maxwell's eq'ns,
about thermodynamics,
about tearing & zooming & linking ...?

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2-nd law $F'(t) = m \frac{d^2}{dt^2} w(t)$

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OPEN SYSTEMS

2-nd law $F'(t) = m \frac{d^2}{dt^2} w(t)$

gravity $F''(t) = m \frac{1_{w(t)}}{|w(t)|^2}$

3-rd law $F'(t) + F''(t) = 0$



CLOSED SYSTEM

$$\frac{d^2}{dt^2} w(t) + \frac{1_{w(t)}}{|w(t)|^2} = 0$$

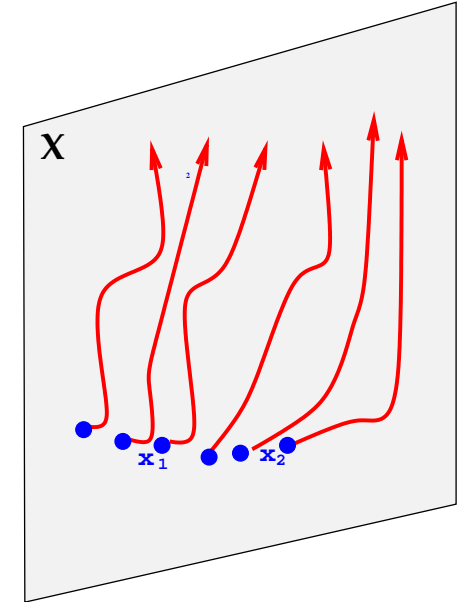
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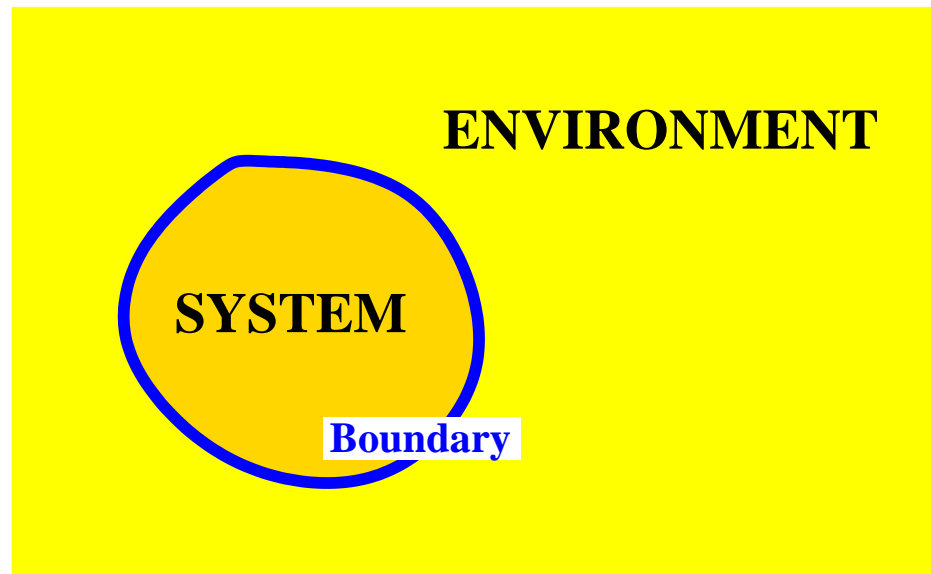
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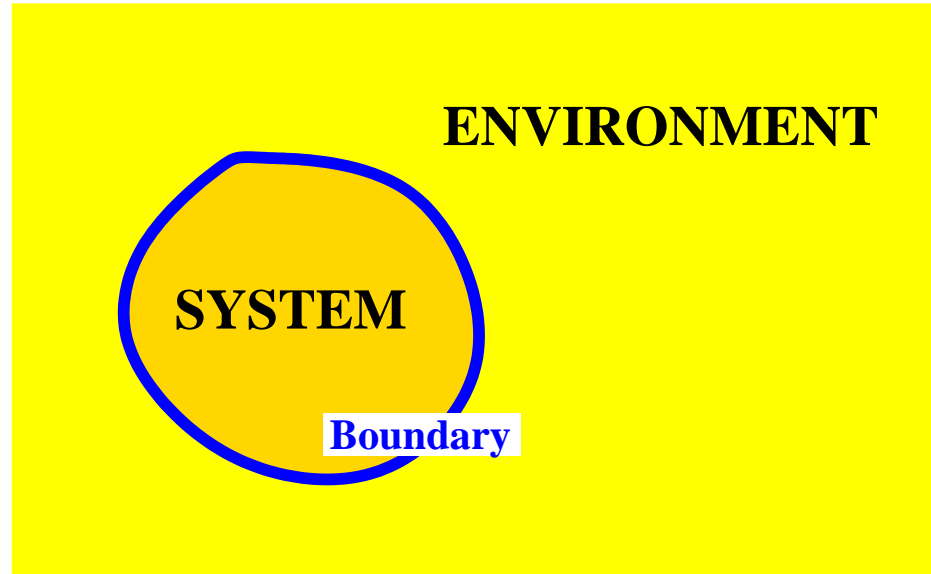
'Axiomatization'

Reply: assume 'fixed boundary conditions'

'fixed' = 'known'



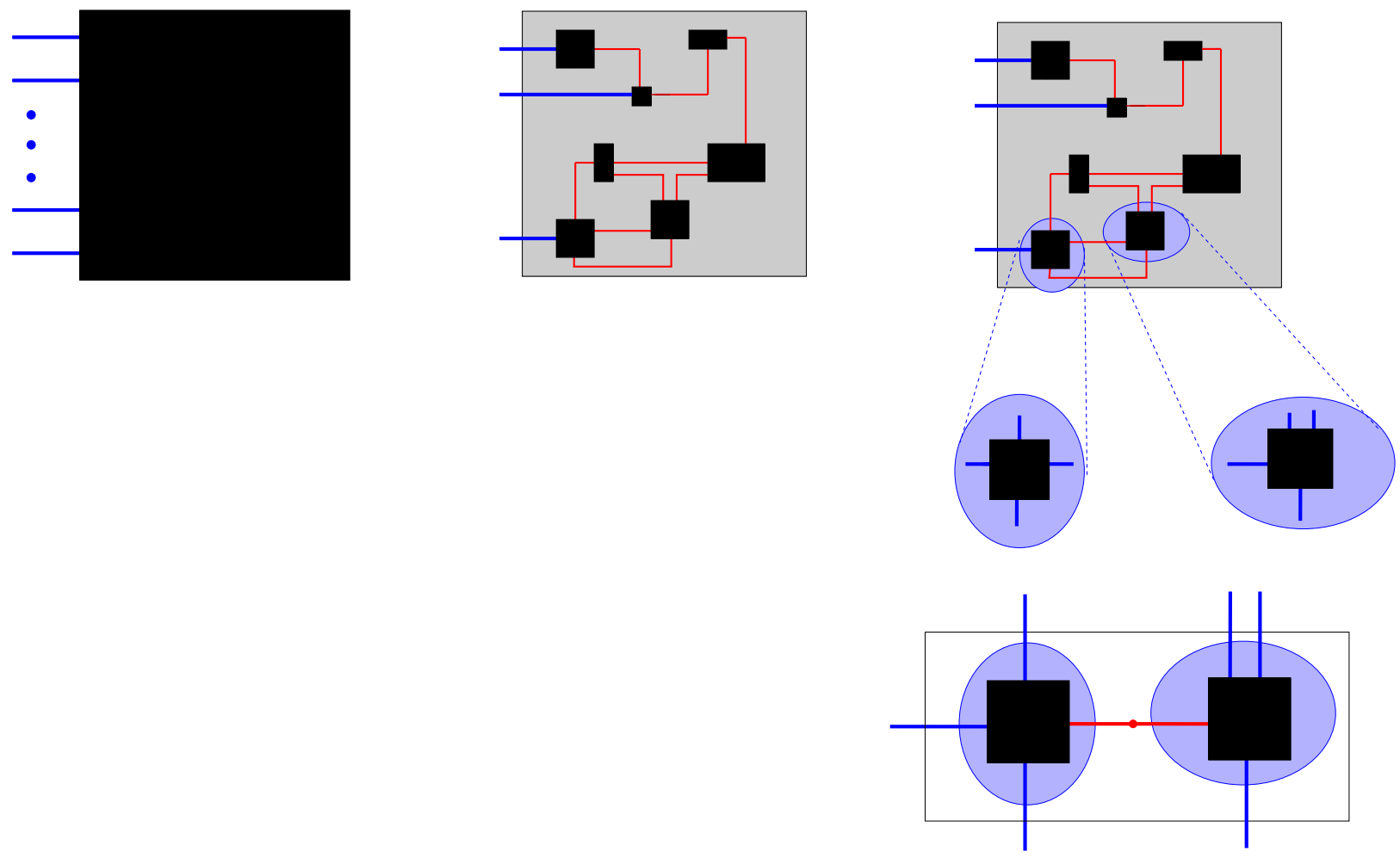
'Axiomatization'



~> to model a system,
we have to model also the environment!

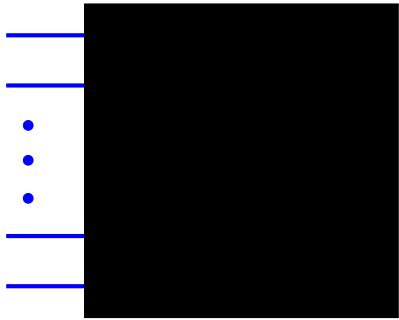
**Chaos theory, cellular automata, sync, etc.,
function in this framework ...**

Tearing-Zooming-Linking

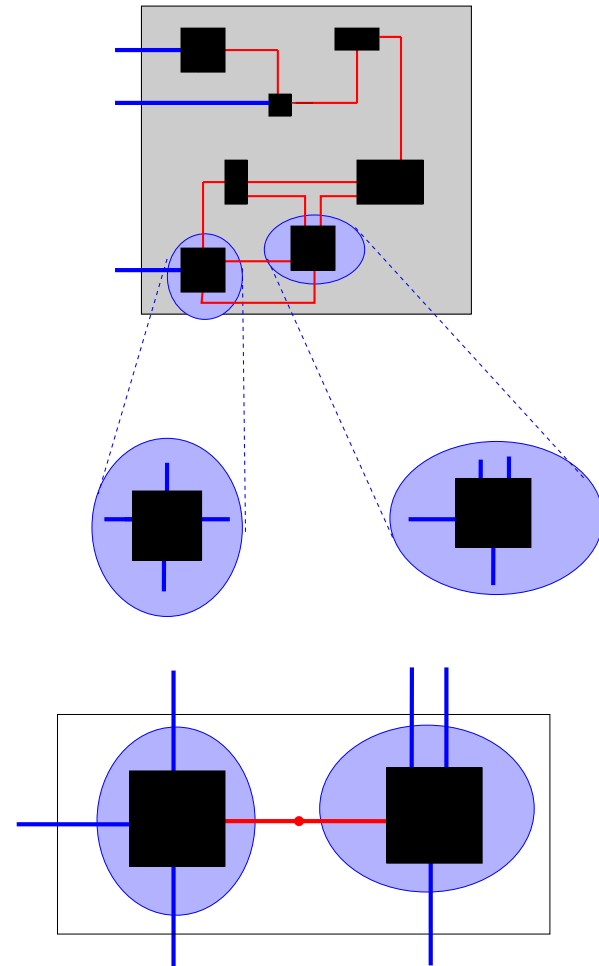
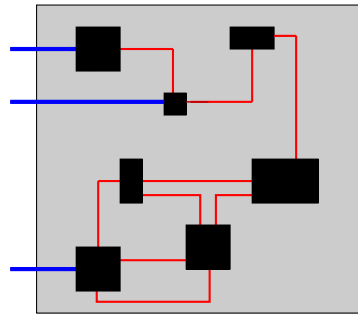


Tearing-Zooming-Linking

Black box

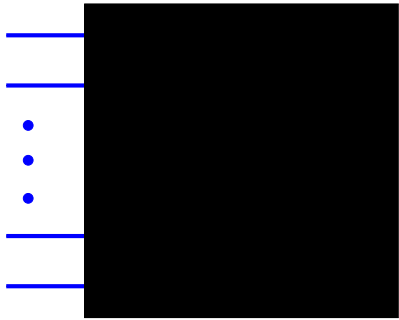


Grey box

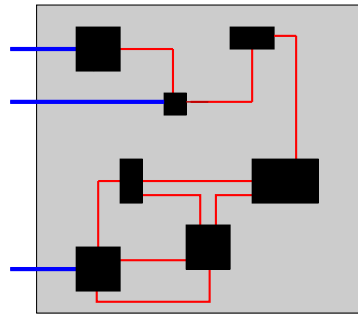


Tearing-Zooming-Linking

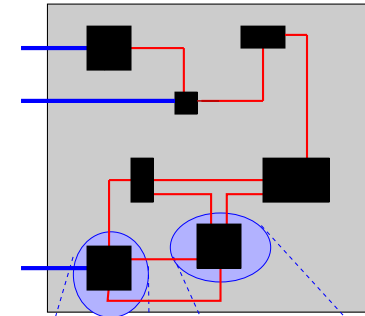
Black box



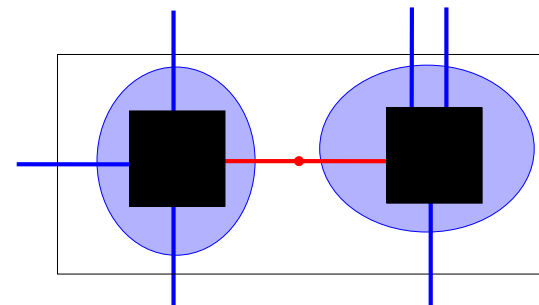
Grey box



TEARING



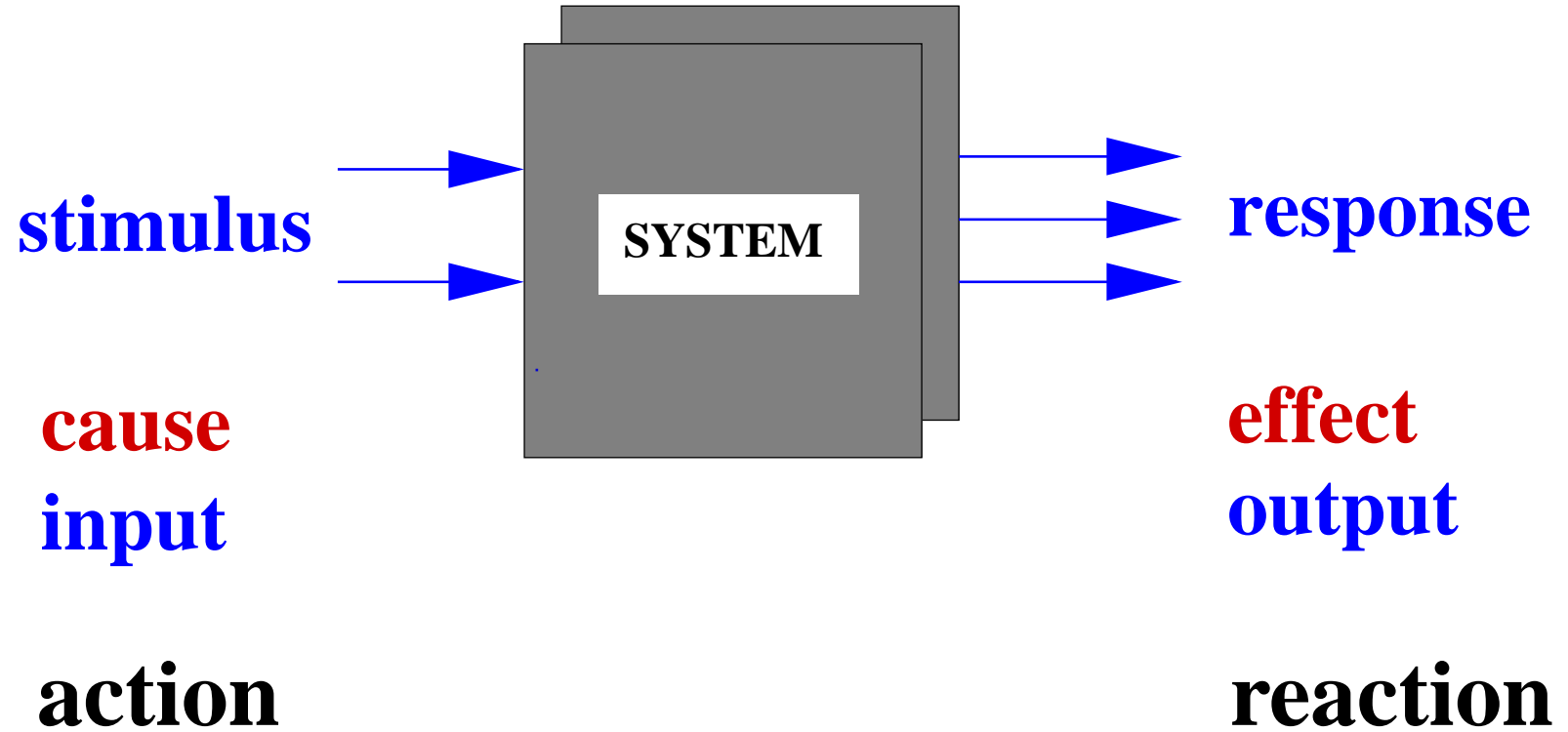
ZOOMING



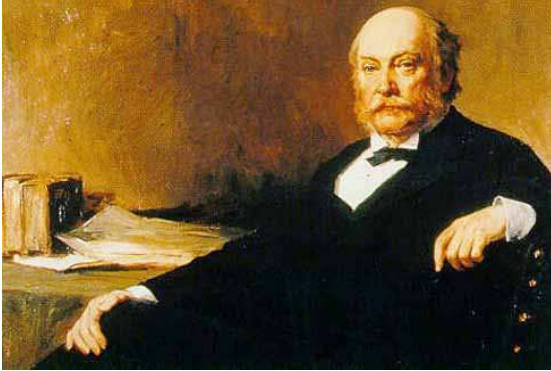
LINKING

Meanwhile, in engineering, ...

Input/output systems



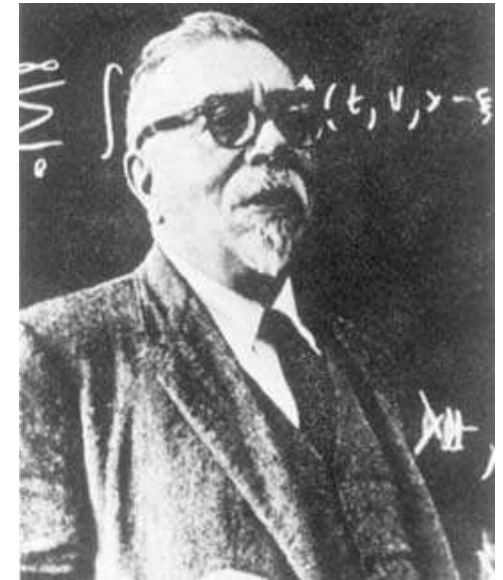
The originators



Lord Rayleigh (1842-1919)



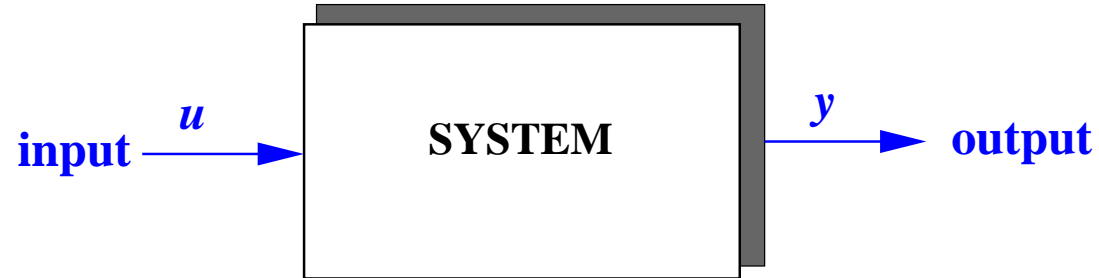
Oliver Heaviside (1850-1925)



Norbert Wiener (1894-1964)

and the many electrical circuit theorists ...

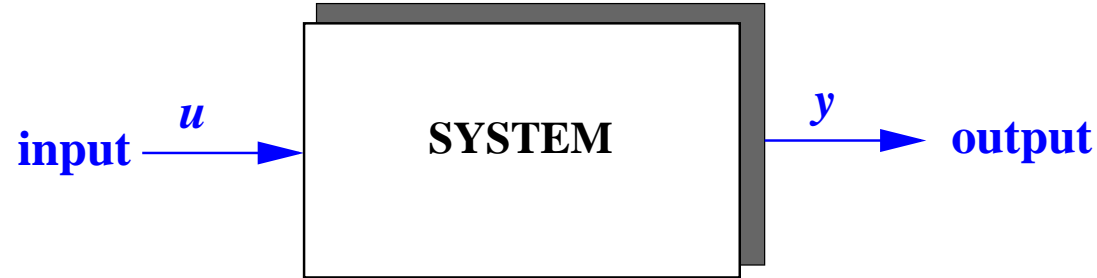
Mathematical description



Classical system theory and control:

u : input, y : output

Mathematical description



These models fail to deal with **‘initial conditions’**.

A physical system is **SELDOM** an i/o map

Nevertheless... in numerous textbooks and ... Wikipedia

An input/output map?



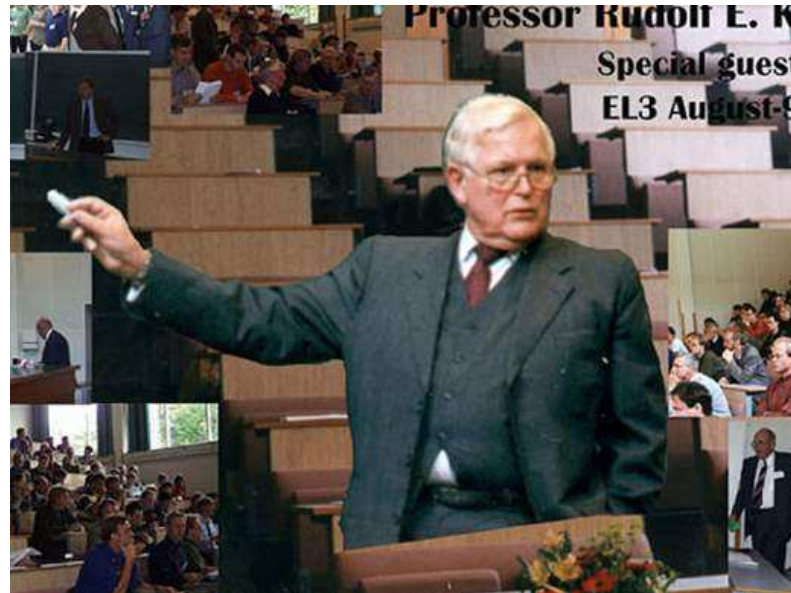
Position history is not a ‘function’, a ‘map’, of force history.

Position depends not only on the force exerted, but also on initial conditions (initial position, velocity).

Input/state/output systems

Around 1960: a **paradigm shift**

$$\leadsto \frac{d}{dt} \mathbf{x} = f(\mathbf{x}, \mathbf{u}), \quad \mathbf{y} = g(\mathbf{x}, \mathbf{u})$$



Rudolf Kalman (1930-)

'Axiomatization'

State transition function:

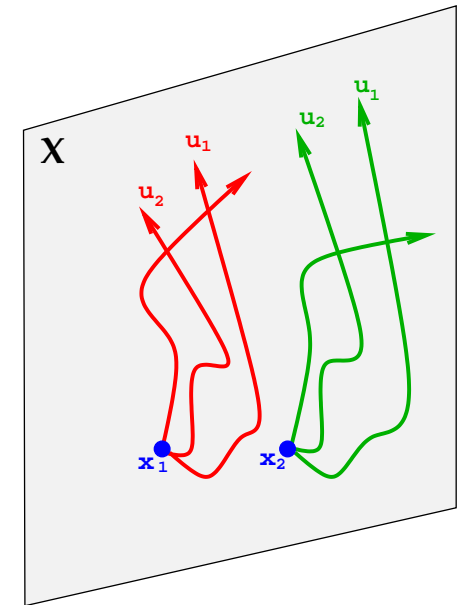
$$\phi(t, \mathbf{x}, \mathbf{u}) :$$

state reached at time t from \mathbf{x} using input \mathbf{u} .

$$\frac{d}{dt} \mathbf{x} = \mathbf{f}(\mathbf{x}, \mathbf{u}), \quad \mathbf{y} = \mathbf{g}(\mathbf{x}, \mathbf{u})$$

Read-out function:

$\mathbf{g}(\mathbf{x}, \mathbf{u})$: output value with state \mathbf{x} and input value \mathbf{u} .

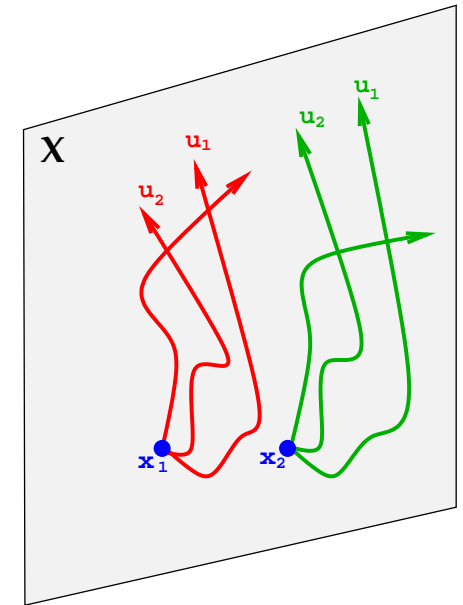


'Axiomatization'

State transition function:

$$\phi(t, \mathbf{x}, u) :$$

state reached at time t from \mathbf{x} using input u .



Simulation scenario:

set initial conditions, choose input function, run model.

Read-out function:

$g(\mathbf{x}, u) :$ output value with state \mathbf{x} and input value u .

Input/state/output systems

The **input/state/output** view turned out to be very effective and fruitful

- for **modeling** dynamical systems (open)
- for **control** (stabilization, robustness, ...)

Input/state/output systems

The **input/state/output** view turned out to be very effective and fruitful

- for **modeling** dynamical systems (open)
- for **control** (stabilization, robustness, ...)
- signal processing, **prediction**, **filtering**
- learning, adaptation
- **system identification:** dynamic models from data
- many technological applications, control engineering, signal processing, technology,...
- etc., etc., etc.

Input/state/output systems

Around 1960: a **paradigm shift**

$$\rightsquigarrow \frac{d}{dt} \mathbf{x} = f(\mathbf{x}, \mathbf{u}), \quad \mathbf{y} = g(\mathbf{x}, \mathbf{u})$$



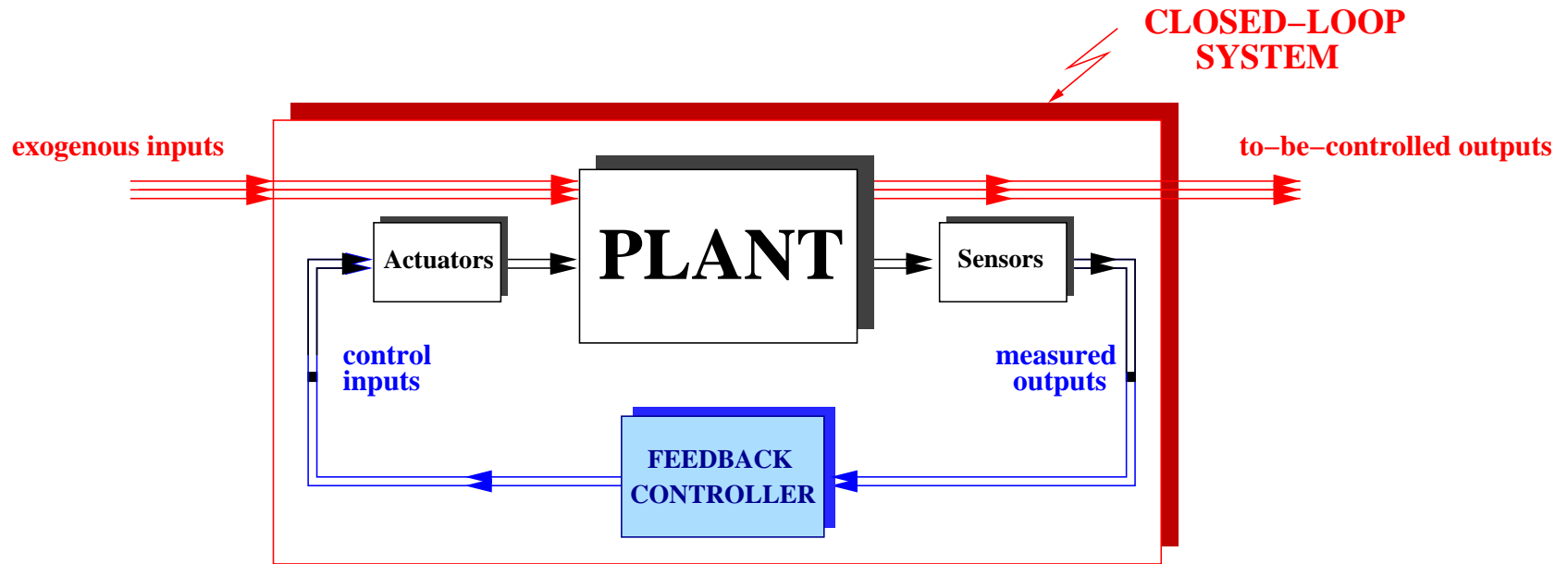
Excellent example of where a better mathematical framework stimulated engineering research.

Let's take a closer look at the i/o framework ...

in control

Difficulties with i/o

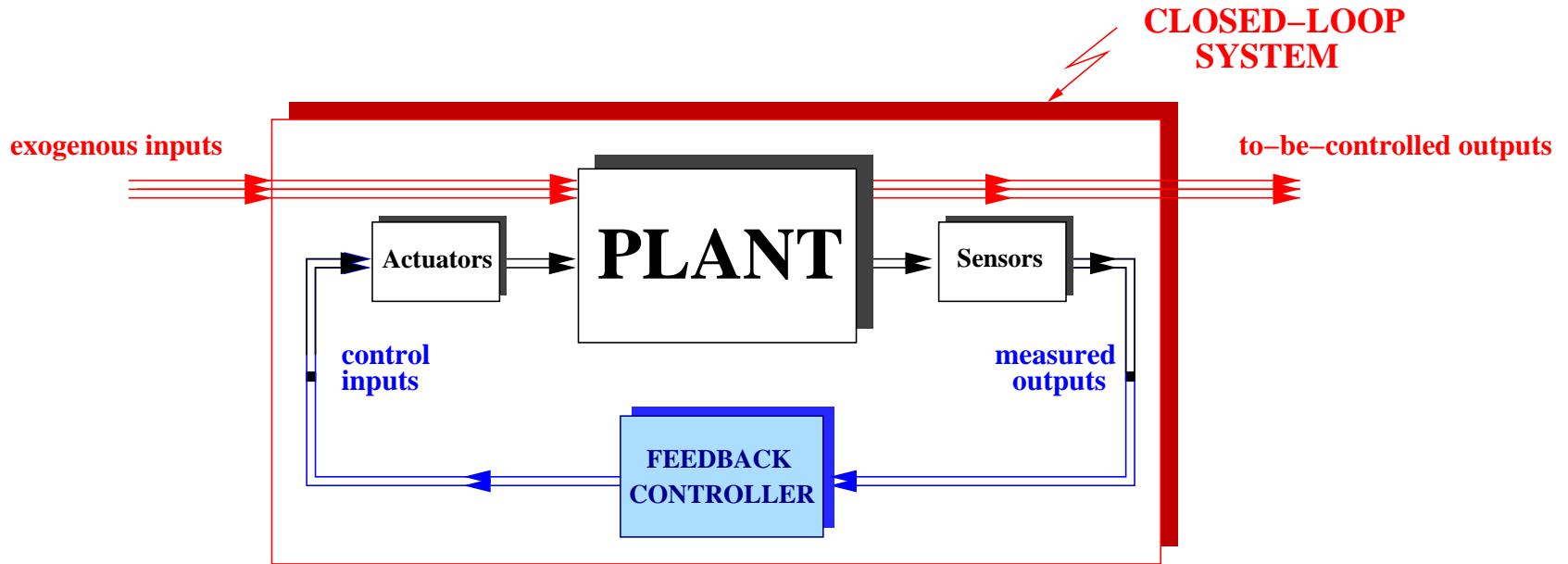
active control



Very intelligent, very useful, ... but general?

Difficulties with i/o

active control



versus **passive control**

**Dampers, heat fins, pressure valves, grooves and strips, ...
Controllers without sensors and actuators**

Difficulties with i/o

active control versus **passive** control

Controlling turbulence

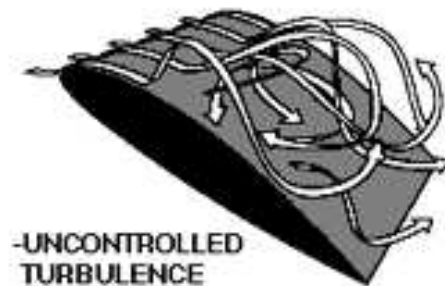
airplanes, sharks, dolphins, golf balls, bicycling helmets, etc.



Difficulties with i/o

active control versus passive control

Controlling turbulence



Difficulties with i/o

active control versus passive control

Controlling turbulence

Nagano 1998



Difficulties with i/o

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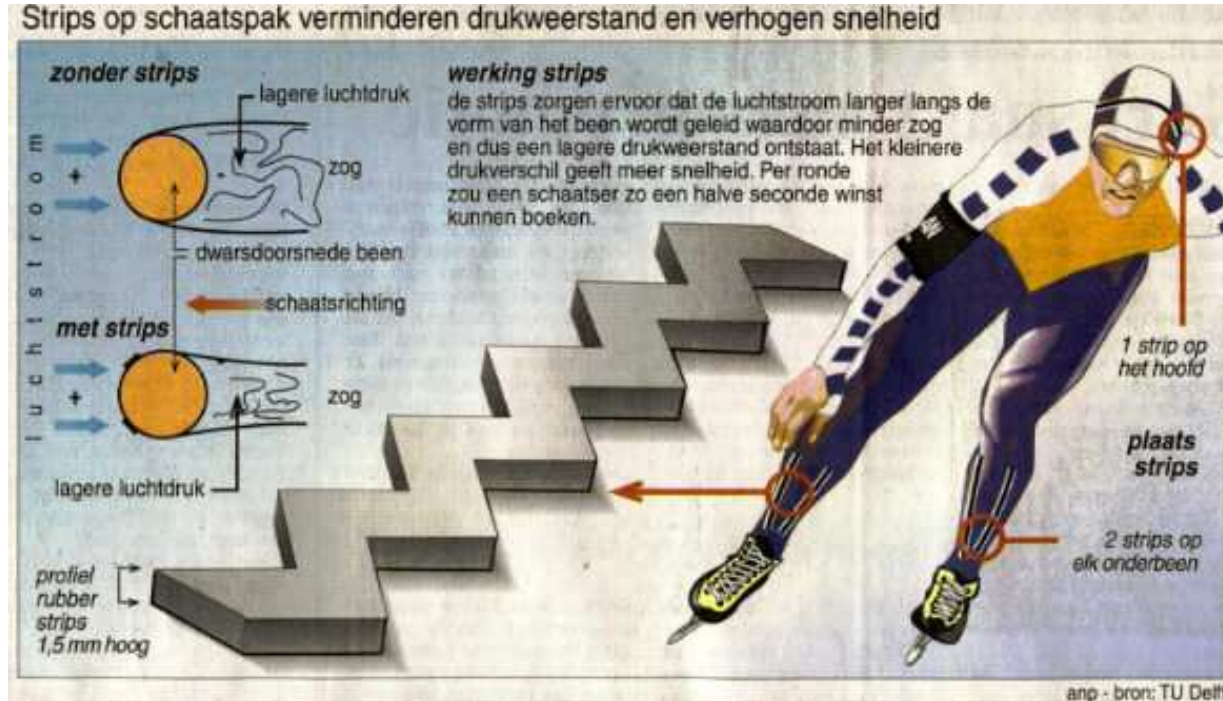


Difficulties with i/o

active control versus passive control

Controlling turbulence

Nagano 1998

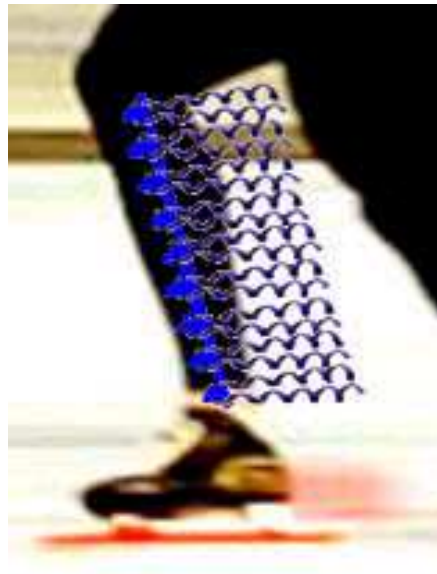


Difficulties with i/o

active control versus passive control

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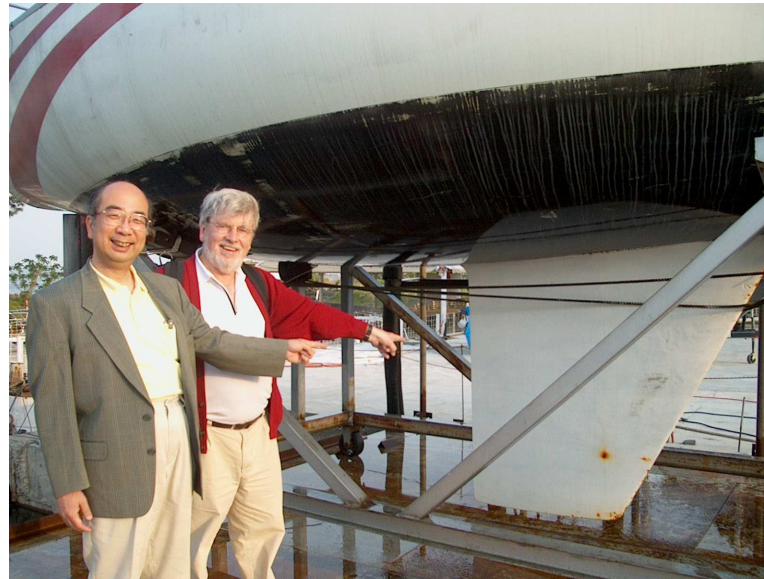
These are beautiful **controllers!**

But, in **control**, this is not viewed as “**control**” ...

Difficulties with i/o

active control versus **passive** control

Another example: the stabilizer of a ship



These are beautiful **controllers**!

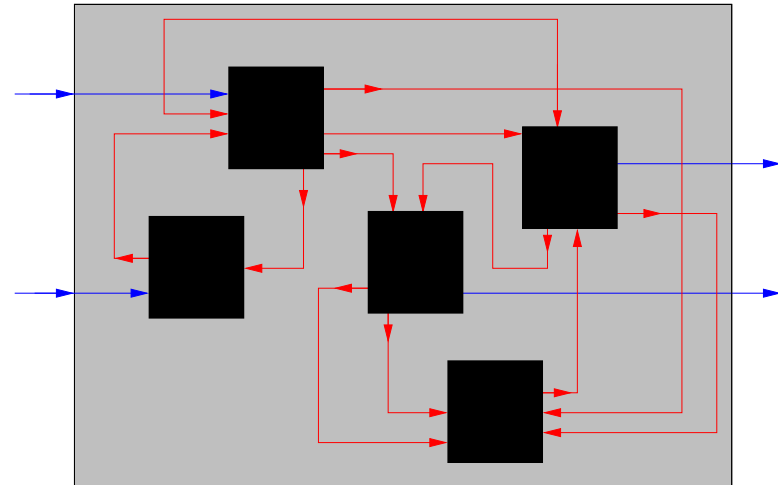
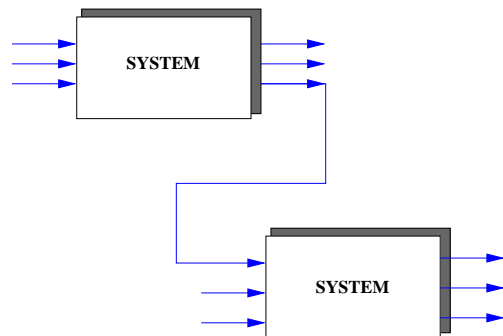
But, in **control** this is not called “**stabilization**” ...

Let's take a closer look at the i/o framework ...

for interconnection

i/o and interconnection

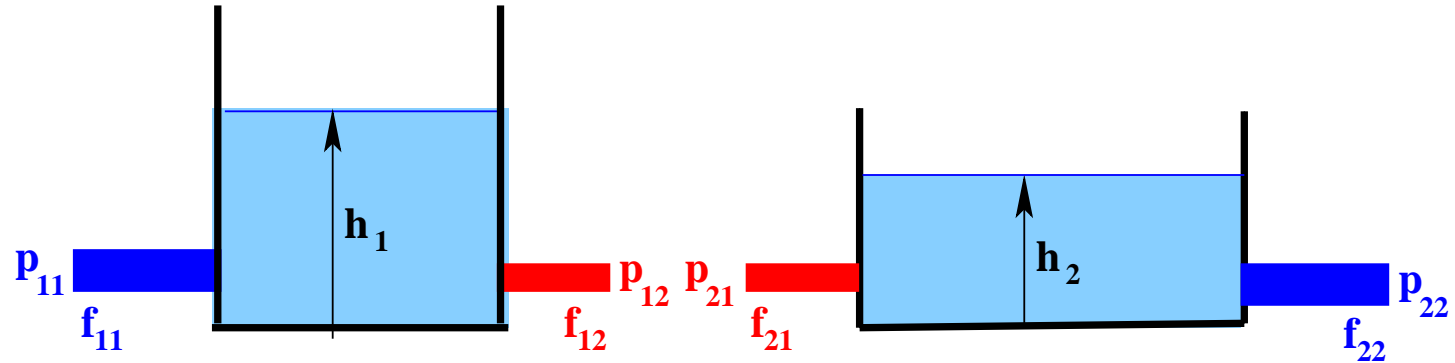
Interconnection:



Output-to-input assignment

~> **SIMULINK[©]**

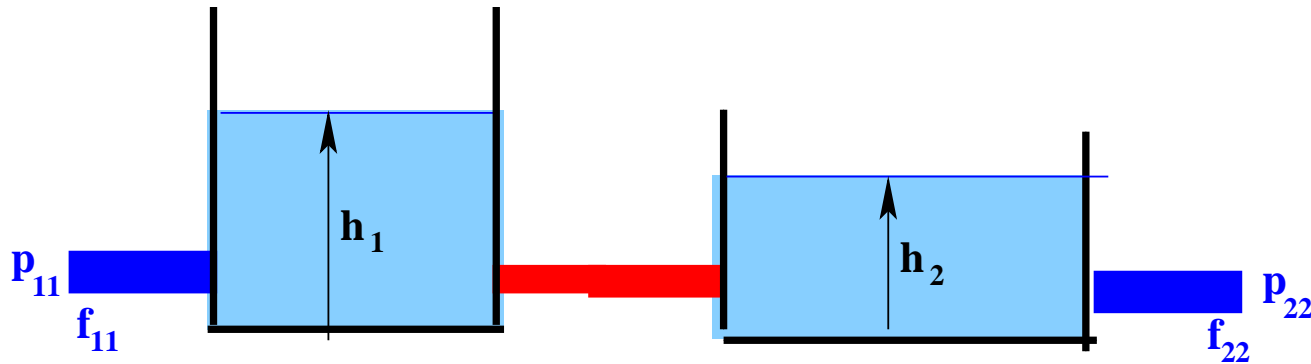
i/o and interconnection



inputs: the pressures $p_{11}, p_{12}, p_{21}, p_{22}$

outputs: the flows $f_{11}, f_{12}, f_{21}, f_{22}$

i/o and interconnection



Interconnection:

$$p_{12} = p_{21}, f_{12} + f_{21} = 0$$

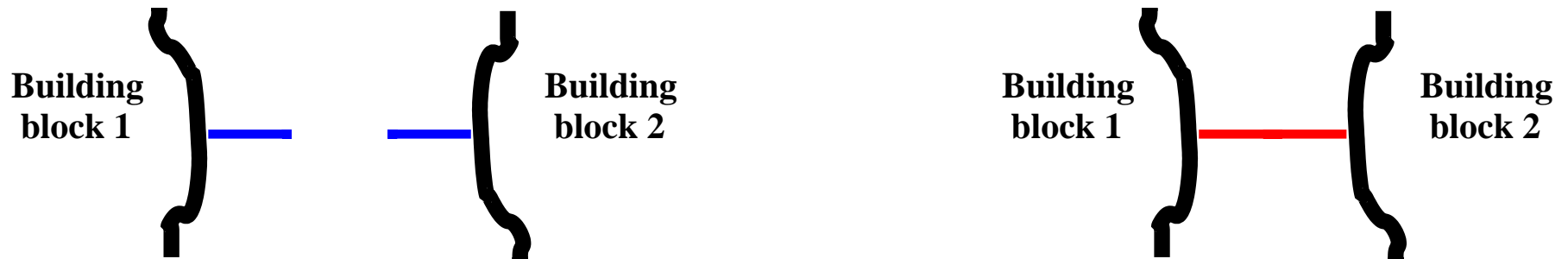
Identifies 2 inputs **AND (NOT WITH)** 2 outputs,
the sort of thing SIMULINK[©] forbids.

This is **the rule, not the exception** (in hydraulics, mechanics, ...)

Interconnection is not input-to-output assignment!

Sharing variables, not input-to-output assignment,

is the mechanism by which physical systems interact.



Before interconnection:

variables on interconnected terminals are **independent**.

After interconnection: they are set equal.

No signal graphs!

Conclusion

The inability of the i/o framework to deal properly with

(i) **interconnections**

and

(ii) **passive control**

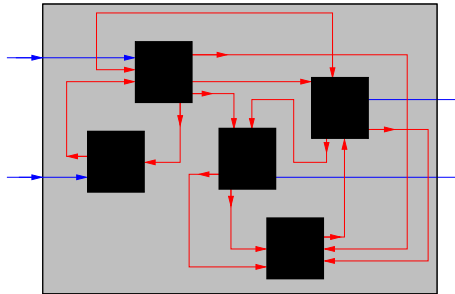
is a serious shortcoming. **It just doesn't fit**

Like the state, the input/output partition, if needed, should be **constructed** from first principles models. Contrary to the state, such a partition **may not be useful**, or even possible.

We need a better, more flexible, universal, framework that properly deals with

open & connected.

Conclusion



“Block diagrams unsuitable for serious physical modeling

- the control/physics barrier”

“Behavior based (declarative) modeling is a good alternative”



from K.J. Åström

Present Developments in Control Applications



IFAC 50-th Anniversary Celebration

Heidelberg, September 12, 2006.

General formalism

Generalities

What is a model? As a **mathematical** concept.

What is a **dynamical** system?

What is the role of **differential equations** in thinking about dynamical models?

Generalities

Intuition

We have a ‘phenomenon’ that produces ‘outcomes’ (‘events’).
We wish to **model** the outcomes that **can** occur.

Before we model the phenomenon:

the outcomes are in a set, which we call the *universum*.

After we model the phenomenon:

the outcomes are declared (thought, believed)
to belong to the *behavior* of the model,
a subset of this universum.

This subset =: a mathematical model.

Mathematization

This way we arrive at the

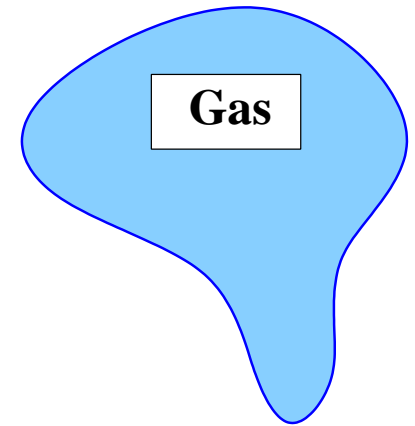
Definition

A *math. model* is a subset \mathfrak{B} of a universum \mathfrak{U} of outcomes

$$\mathfrak{B} \subseteq \mathfrak{U}.$$

\mathfrak{B} is called the *behavior* of the model.

Mathematization



For example, **the ideal gas law** states that the temperature T , pressure P , volume V , and quantity (number of moles) N satisfy

$$\frac{PV}{NT} = R$$

with R a universal constant.

So, before Boyle, Charles, and Avogadro got into the act, T , P , V and N may have seemed unrelated, yielding

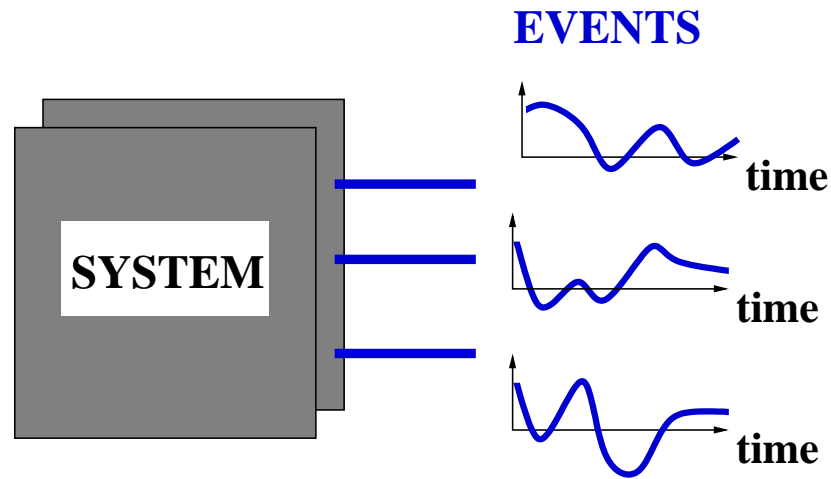
$$\mathfrak{U} = \mathbb{R}_+^4.$$

The ideal gas law restricts the possibilities to

$$\mathfrak{B} = \{(T, P, V, N) \in \mathbb{R}_+^4 \mid PV/NT = R\}$$

Dynamical systems

In dynamics, the outcomes are functions of time \rightsquigarrow



Which event trajectories are possible?

Dynamical systems

Definition

A dynamical system = $\Sigma := (\mathbb{T}, \mathbb{W}, \mathfrak{B})$

with $\mathbb{T} \subseteq \mathbb{R}$, the *time-axis* (= the relevant time instances),
 \mathbb{W} , the *signal space*

(= where the variables take on their values),

$\mathfrak{B} \subseteq \mathbb{W}^{\mathbb{T}}$ the *behavior* (= the admissible trajectories).

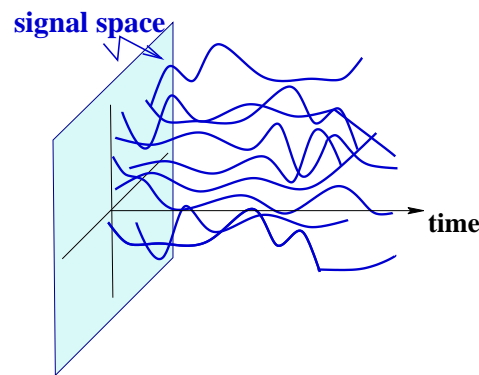
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Totality of ‘legal’ trajectories =: the behavior

Dynamical Systems

The behavior is all there is

Equivalence, representations, symmetries, controllability, model simplification, etc. must refer to the behavior.

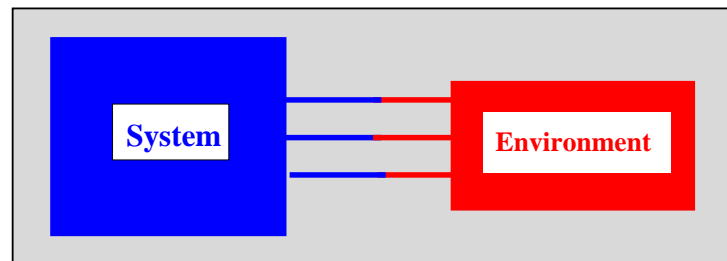
Simulation scenario:

choose model for environment

initial conditions of system

initial conditions for environment

run the full model.



Dynamical Systems

The behavior is all there is

Equivalence, representations, symmetries, controllability, model simplification, etc. must refer to the behavior.

In the mean time there is a rich theory of dynamical systems with **behaviors as central notion.**

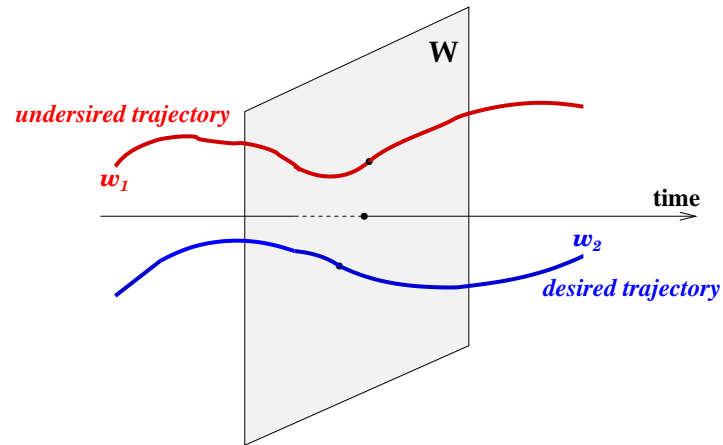
But, compared to **flows and **input/state/output** systems,**

this theory is *in statu nascendi*.

Controllability

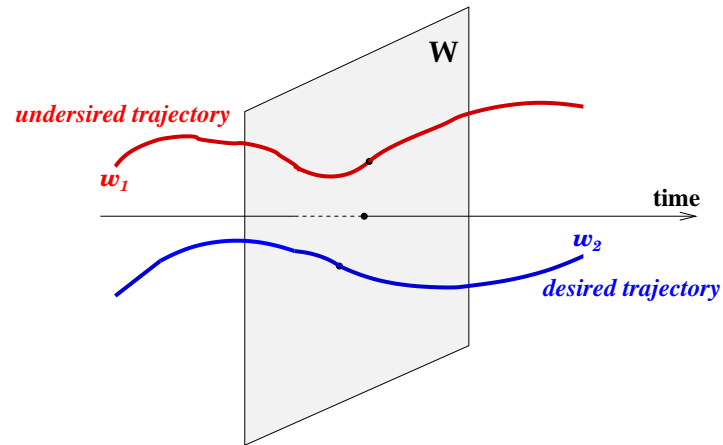
Controllability

Take any two trajectories $w_1, w_2 \in \mathfrak{B}$.

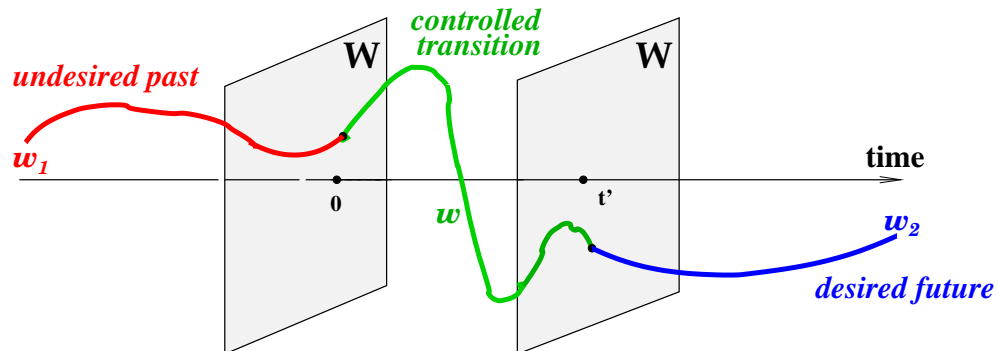


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'Controllability':



PDE's

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$\mathbb{T} = \mathbb{R}^n$, the set of **independent** variables, often $n = 4$,

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So, the behavior consists of a family of functions of
time and space, i.e. 'fields'.

Elasticity, continuum mechanics

Waves

Heat diffusion

etc.

Example

Maxwell's eq'ns, diffusion eq'n, wave eq'n, . . .



$$\begin{aligned}\nabla \cdot \vec{E} &= \frac{1}{\epsilon_0} \rho, \\ \nabla \times \vec{E} &= -\frac{\partial}{\partial t} \vec{B}, \\ \nabla \cdot \vec{B} &= 0, \\ c^2 \nabla \times \vec{B} &= \frac{1}{\epsilon_0} \vec{j} + \frac{\partial}{\partial t} \vec{E}.\end{aligned}$$

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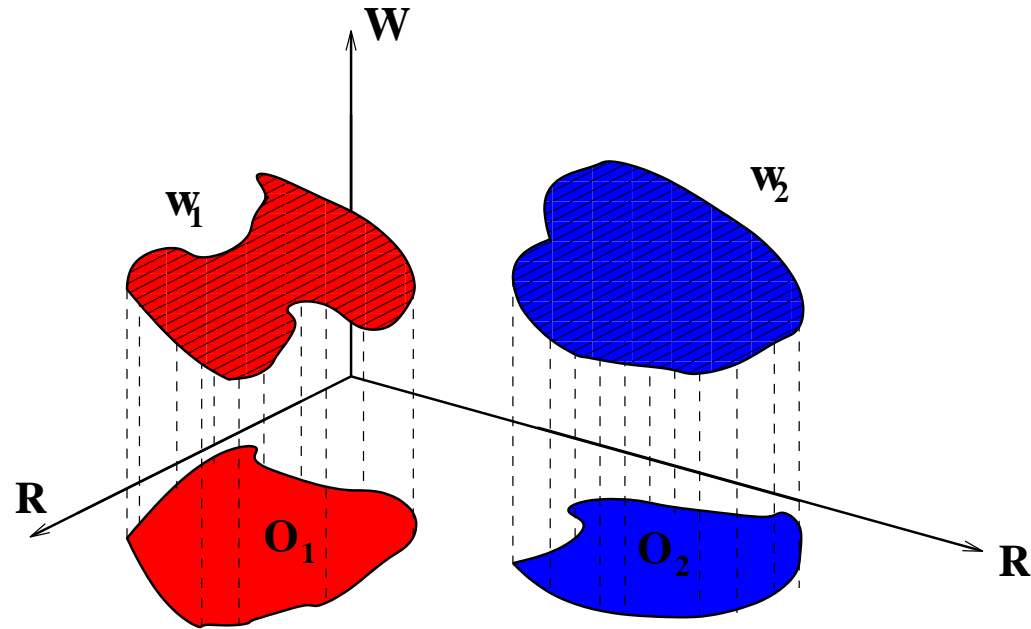
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**PDE's, as Maxwell's equations, define open systems,
but not input/output,
& the notion of state has not been thought out.**

Controllability for PDE's

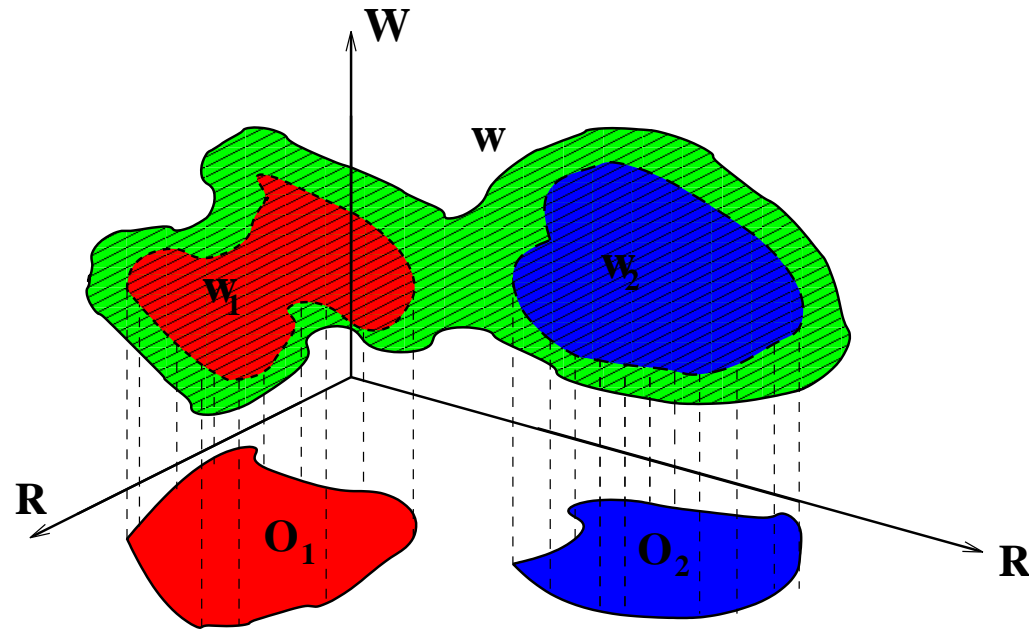
Controllability def'n in pictures:



$$w_1, w_2 \in \mathcal{B}.$$

Controllability for PDE's

$w \in \mathfrak{B}$ 'patches' $w_1, w_2 \in \mathfrak{B}$.



Controllability : \Leftrightarrow 'patch-ability'.

Are Maxwell's equations controllable ?

Are Maxwell's equations controllable ?

YES, they are indeed!

controllability \Leftrightarrow there exists a potential!

Summary

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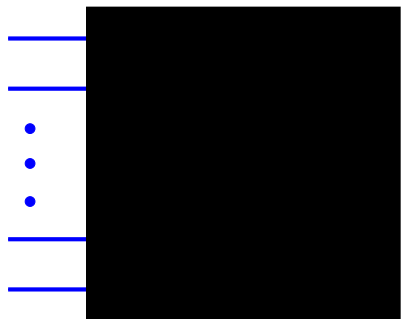
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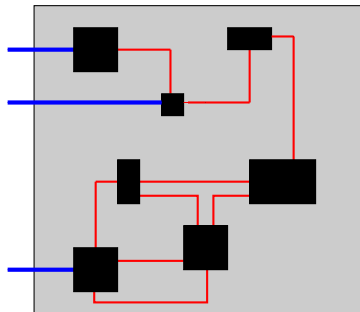
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- **Input/output adds signal flow, not present in the physics.**
- Behavioral modeling of open systems, with interconnection as variable sharing, tearing-zooming-linking, **gets the physics right**

Summary

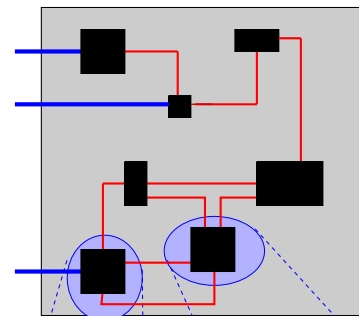
Black Box



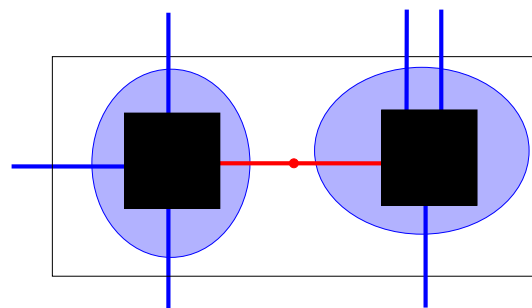
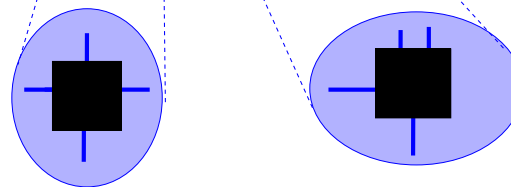
Greybox



TEARING



ZOOMING



LINKING

Details & copies of the lecture frames are available from/at

Jan.Willems@esat.kuleuven.be

<http://www.esat.kuleuven.be/~jwillems>

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Thank you

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