



# **SYSTEMS THEORY and PHYSICAL MODELS**

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**Universidade de Aveiro, 3 de junho 2004**



## Problematique

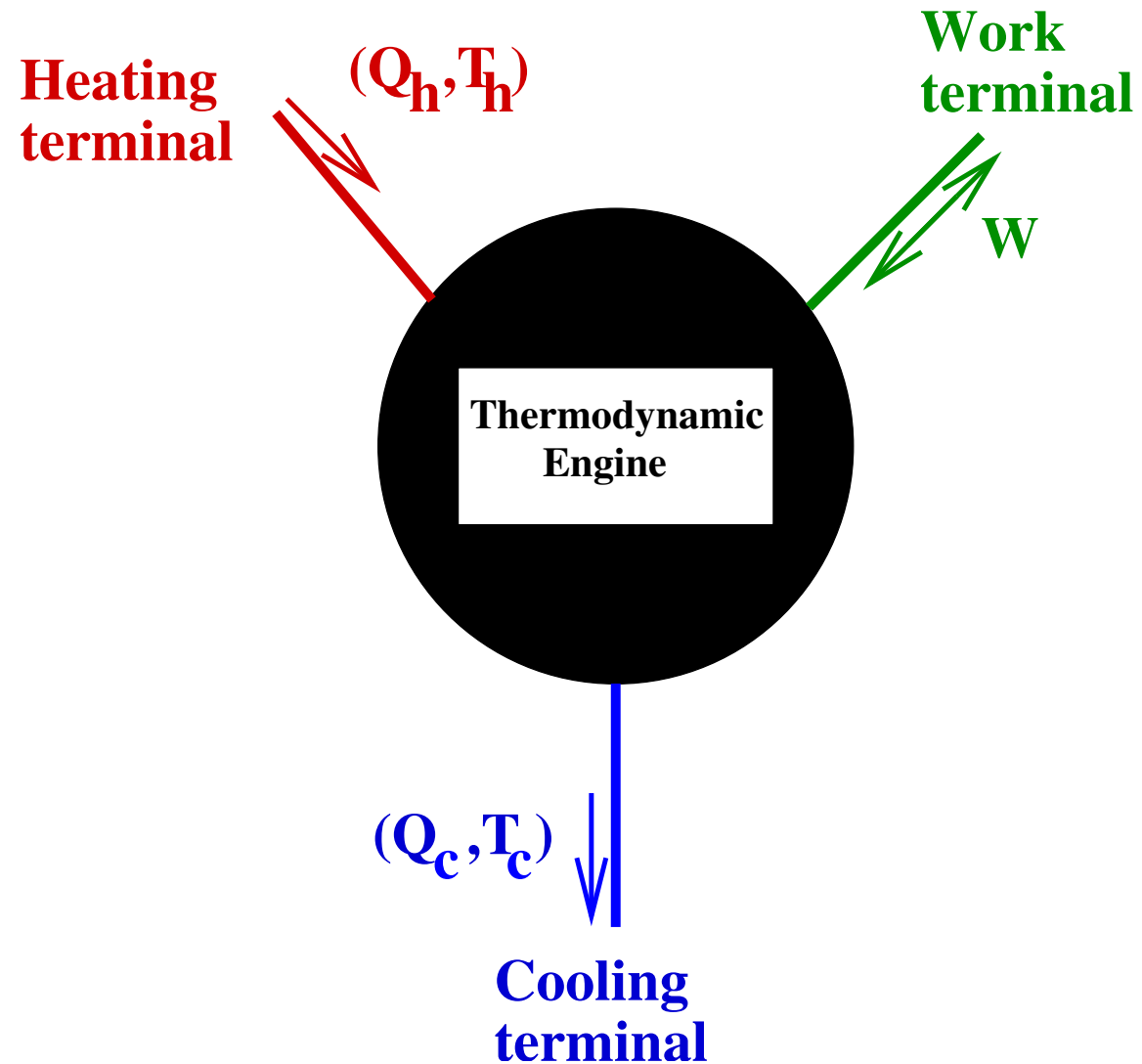
Develop a suitable *mathematical* framework  
for discussing dynamical systems

aimed at **modeling**, analysis, and synthesis.

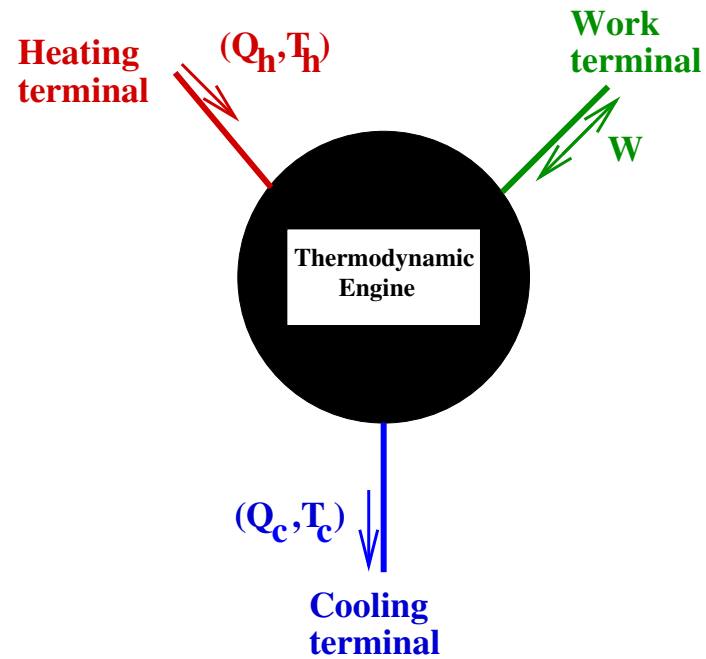
~> control, signal processing, system id., . . .

~> engineering systems, economics, physics, . . .

# Paradigmatic examples - thermodynamics



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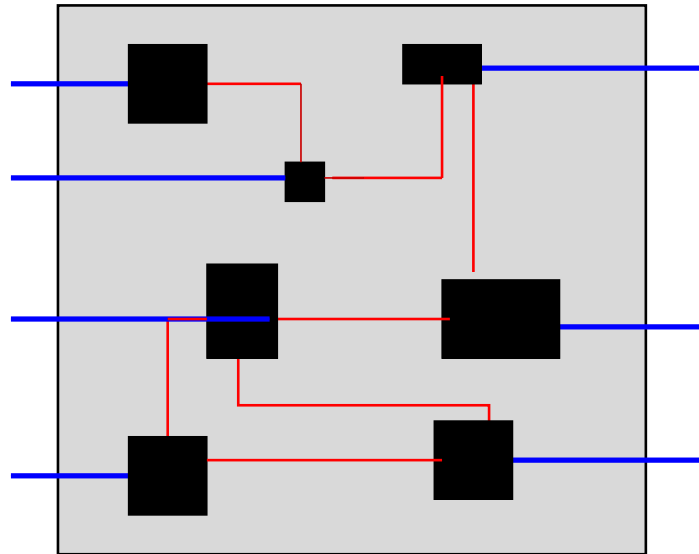


**Express the first and second law**

~> ?

## Paradigmatic examples - modeling

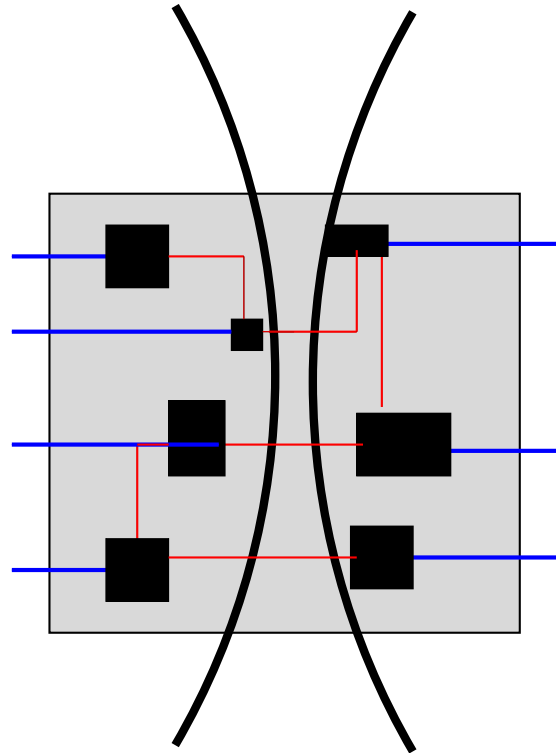
¡ Model this interconnected system !



**Tearing, zooming & linking**

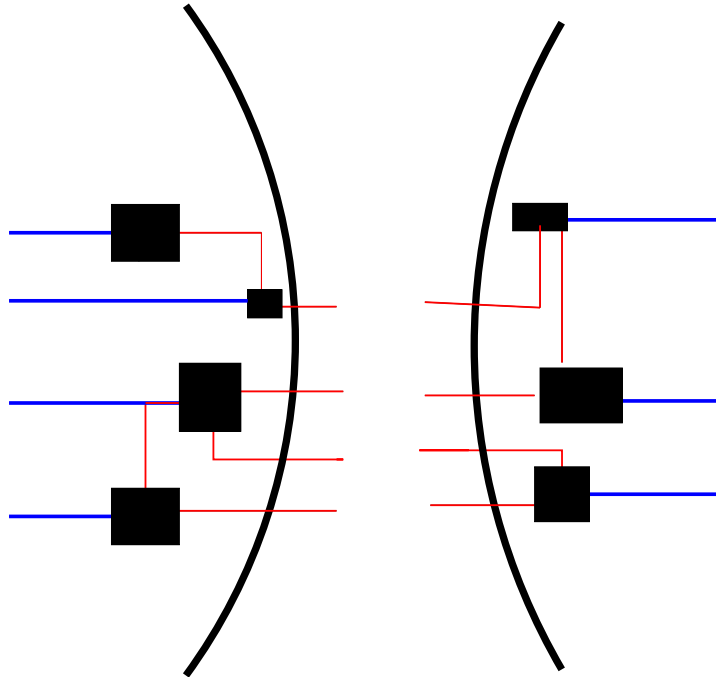
# Paradigmatic examples - modeling

**Tearing:**



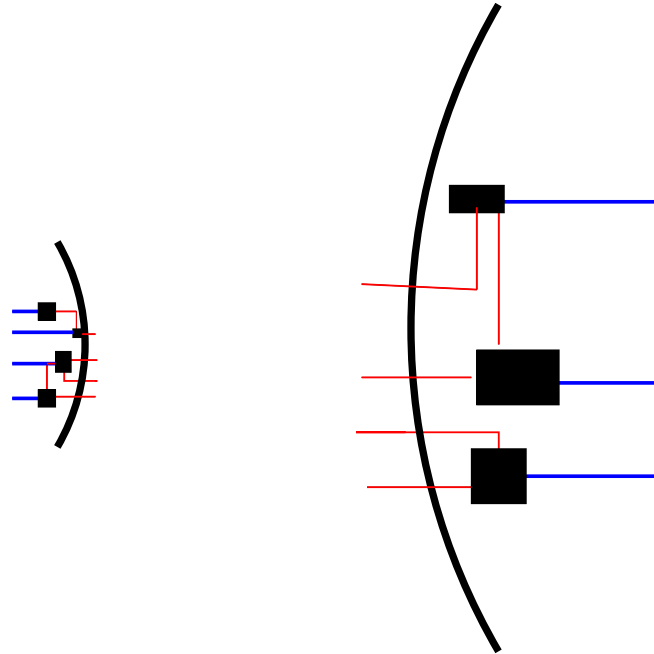
# Paradigmatic examples - modeling

**Tearing:**



# Paradigmatic examples - modeling

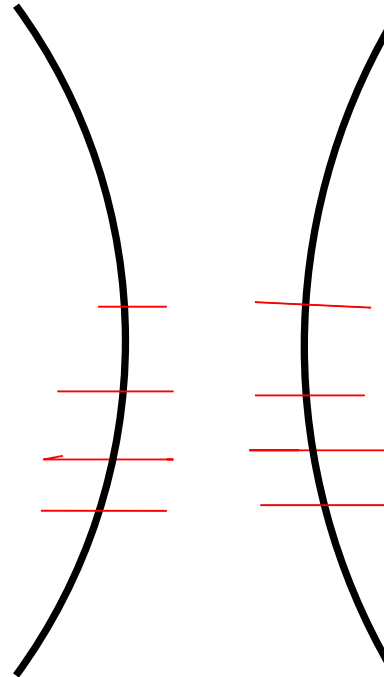
**Zooming:**





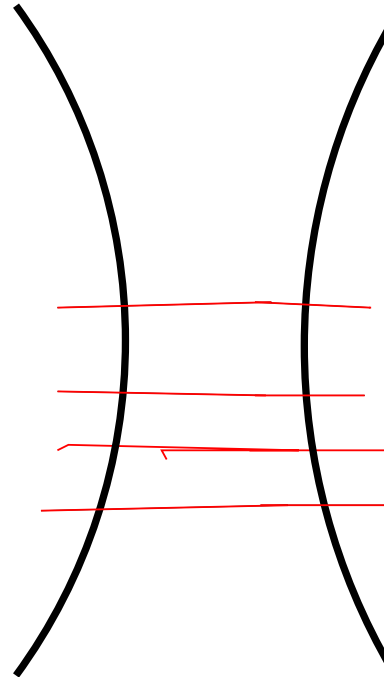
# Paradigmatic examples - modeling

**Linking:**



# Paradigmatic examples - modeling

**Linking:**



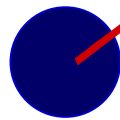
1. **Closed systems**
2. **Input/output ;  
input/**state**/output systems**
3. **Beyond causality: behavioral systems**

1. **Closed systems**
2. **Input/output ;  
input/**state**/output systems**
3. **Beyond causality: behavioral systems**
  - **Submodule thm**
  - **Elimination thm**
  - **Controllability and image representation thm**



***How it all began ...***

**Planet**



**???**

**How does it move?**

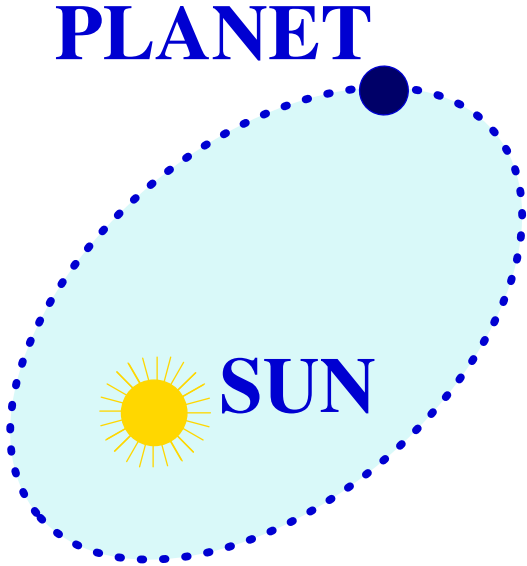
# Kepler's laws



Johannes Kepler (1571-1630)

**Kepler's first law:**

**Ellipse, sun in focus**



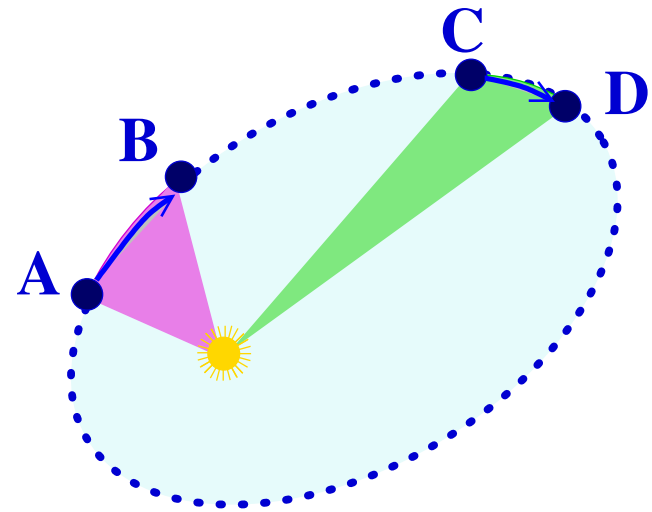
# Kepler's laws



Johannes Kepler (1571-1630)

**Kepler's second law:**

**= areas in = times**





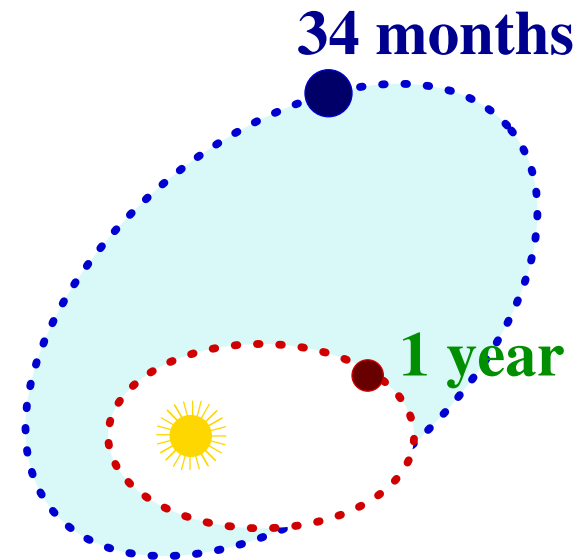
# Kepler's laws



Johannes Kepler (1571-1630)

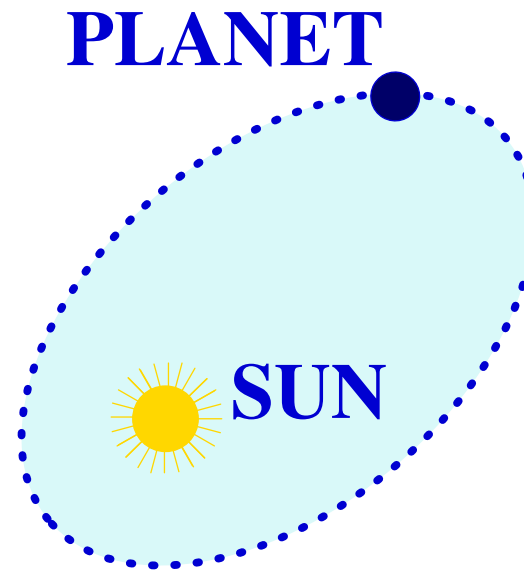
## Kepler's third law:

$$(\text{period})^2 \propto (\text{diameter})^3$$



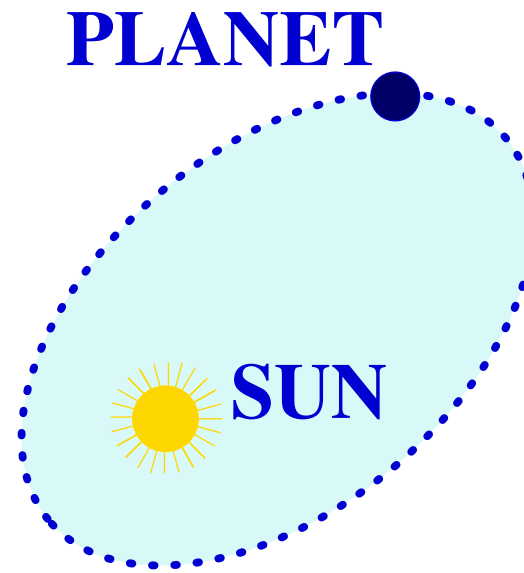
## The state of the planet

What determines the orbit uniquely?



## The state of the planet

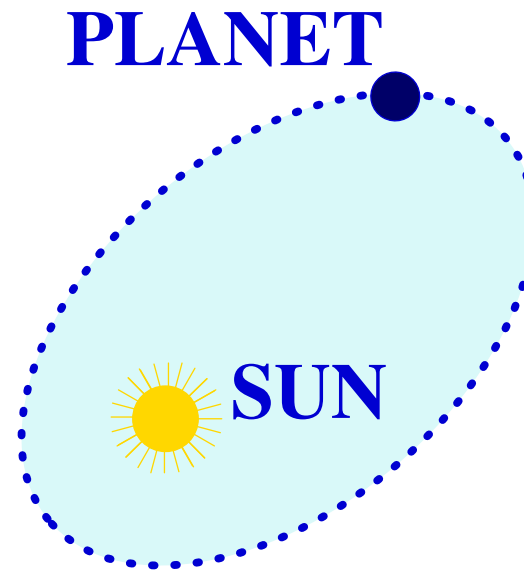
What determines the orbit uniquely?



The position?

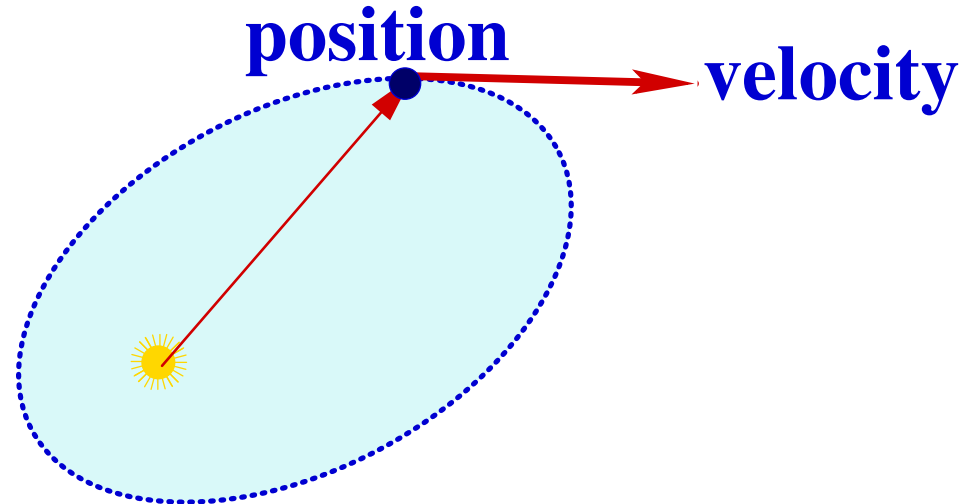
## The state of the planet

What determines the orbit uniquely?



The position and the direction of motion?

## The state of the planet



**The state = the position & the velocity**

## The equation of the planet

**Consequence:**

**acceleration = function of position and velocity**

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

## The equation of the planet

Consequence:

**acceleration = function of position and velocity**

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

~> **via calculus and calculation**

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

## Newton's laws

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

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

$$F'(t) + F''(t) = 0 \quad \text{(3-rd law)}$$



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





## Kepler's laws K.1, K.2, & K.3



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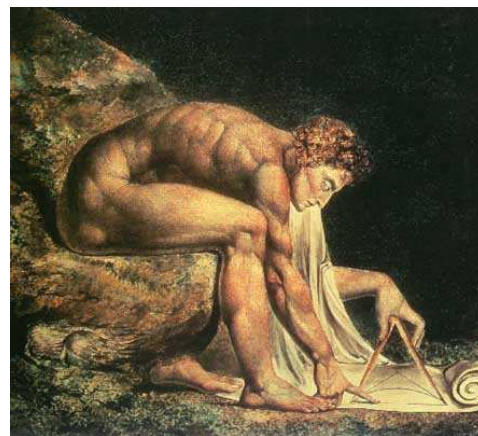
Hypotheses  
non  
fingo

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## Kepler's laws K.1, K.2, & K.3

Hypotheses  
non  
fingo



$$F = m \frac{d^2}{dt^2}w$$



# ***The paradigm of closed systems***



# 'Axiomatization'

**K.1, K.2, & K.3**

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

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$\rightsquigarrow$  'dynamical systems', flows

K.1, K.2, & K.3

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$\rightsquigarrow$  'dynamical systems', flows

$\rightsquigarrow$  closed systems as paradigm of dynamics

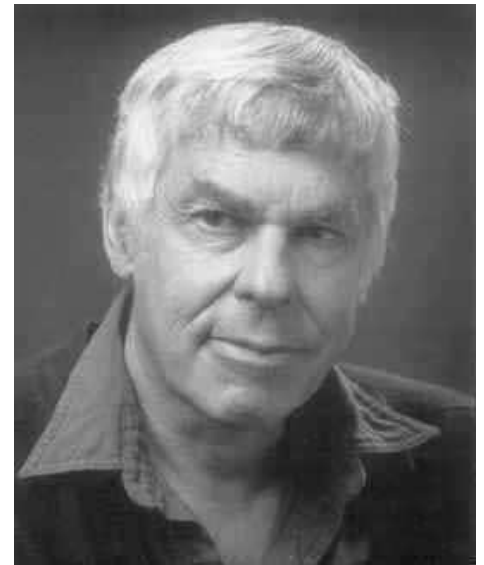
# 'Axiomatization'



**Henri Poincaré (1854-1912)**



**George Birkhoff (1884-1944)**



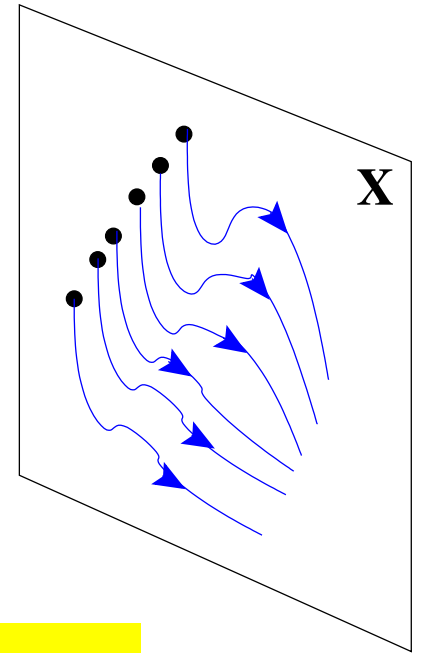
**Stephen Smale (1930- )**

## 'Axiomatization'

A **dynamical system** is defined by  
a **state space**  $X$  and  
a **state transition function**

$\phi : \dots$  such that  $\dots$

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



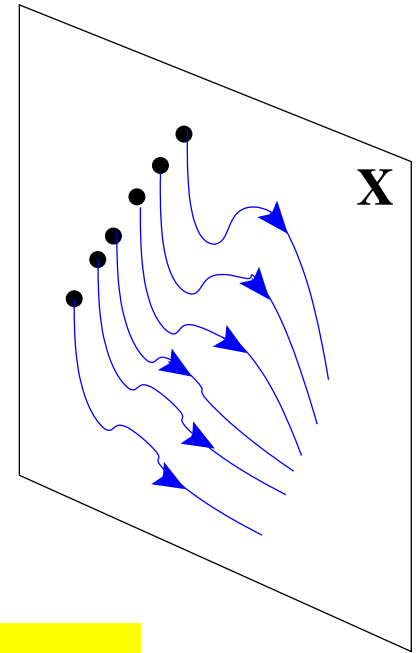
## 'Axiomatization'

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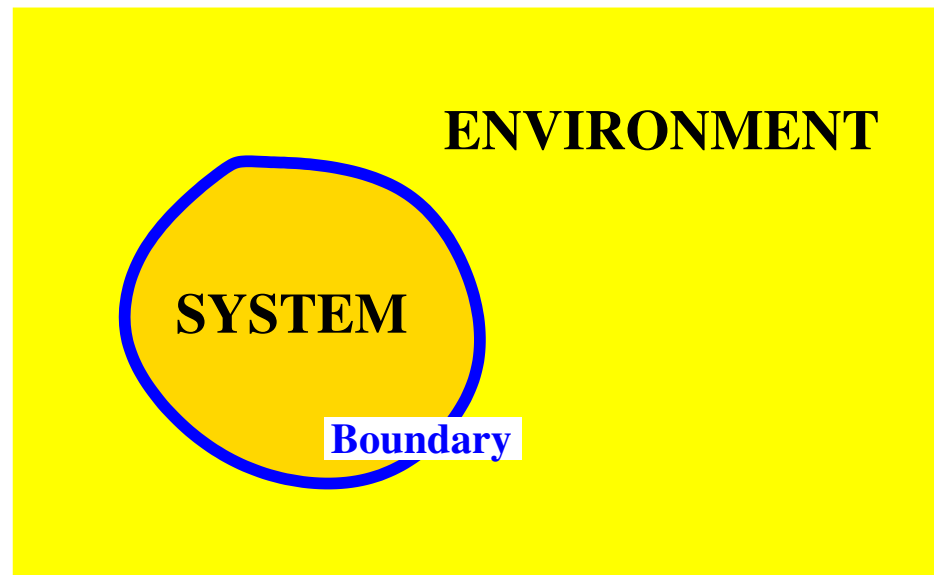
$\phi(t, x)$  = state at time  $t$  starting from state  $x$

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



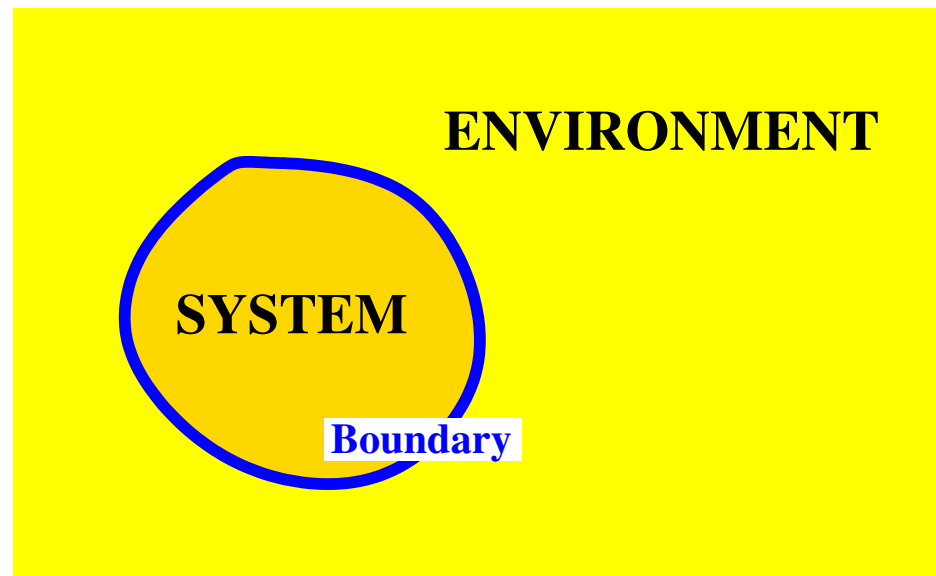
## 'Axiomatization'

Reply: assume **'fixed boundary conditions'**



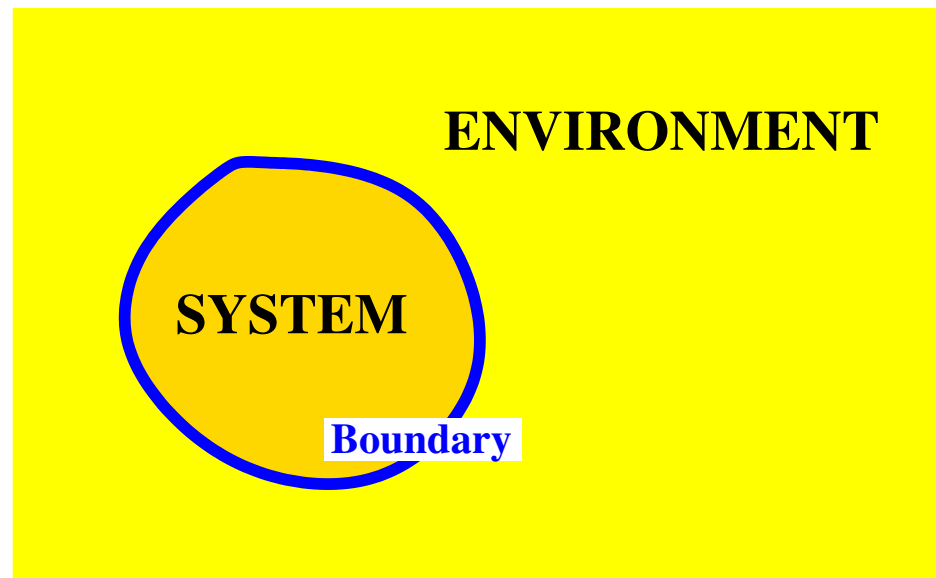
~> **an absurd situation: to model a system,  
we have to model also the environment!**

## 'Axiomatization'



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

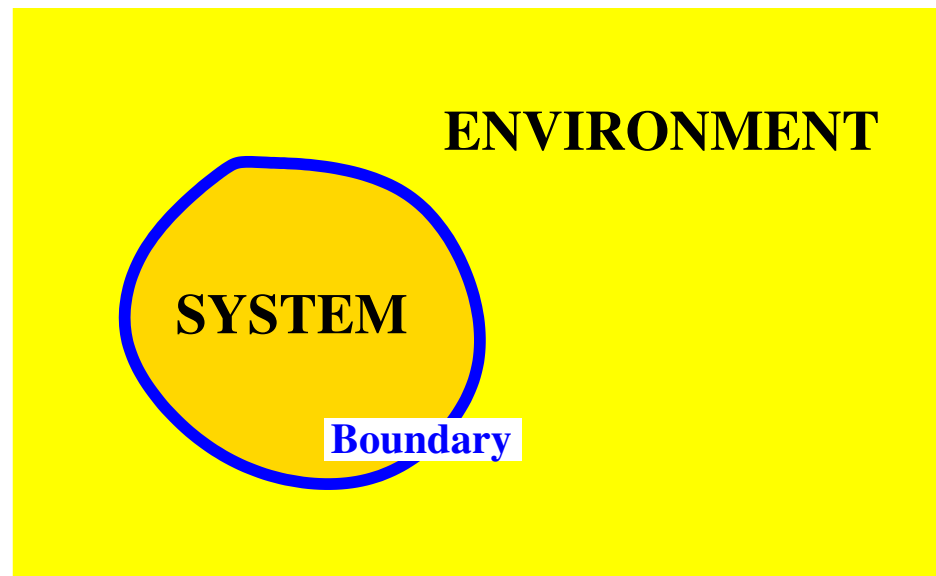
## 'Axiomatization'



**Chaos: not a property of the physical laws,  
but just as much of what the system is  
interconnected to.**



## 'Axiomatization'

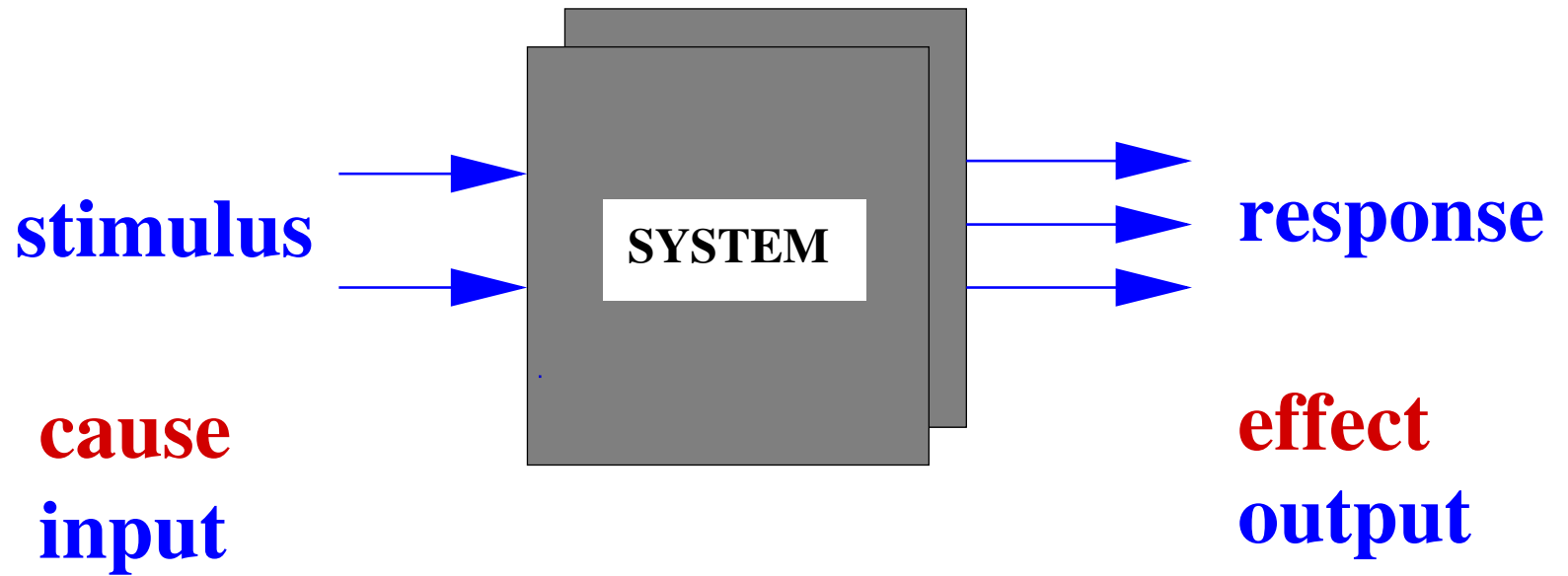


**Turbulence may not be a property of Navier-Stokes, but just as much of the boundary conditions.**



***Meanwhile, in engineering, ...***

# Input/output systems



# The originators



**Lord Rayleigh (1842-1919)**



**Oliver Heaviside (1850-1925)**



**Norbert Wiener (1894-1964)**

## Mathematical description



$$y(t) = \int_{0 \text{ or } -\infty}^t H(t - t') u(t') dt'$$

$$y(t) = H_0(t) + \int_{-\infty}^t H_1(t - t') u(t') dt' + \\ \int_{-\infty}^t \int_{-\infty}^{t'} H_2(t - t', t' - t'') u(t') u(t'') dt' dt'' + \dots$$

## Mathematical description



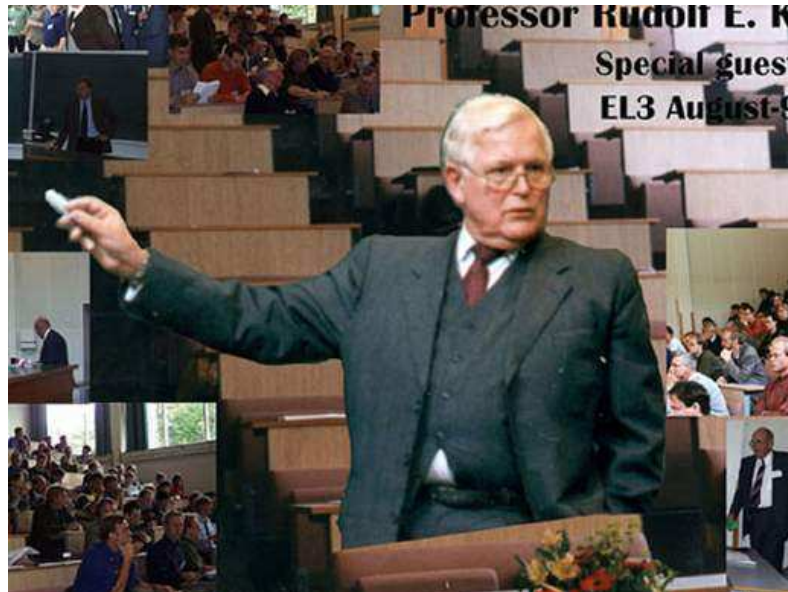
$$y(t) = \int_{0 \text{ or } -\infty}^t H(t - t') u(t') dt'$$

These models fail to deal with **'initial conditions'**.

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

# Input/state/output systems

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

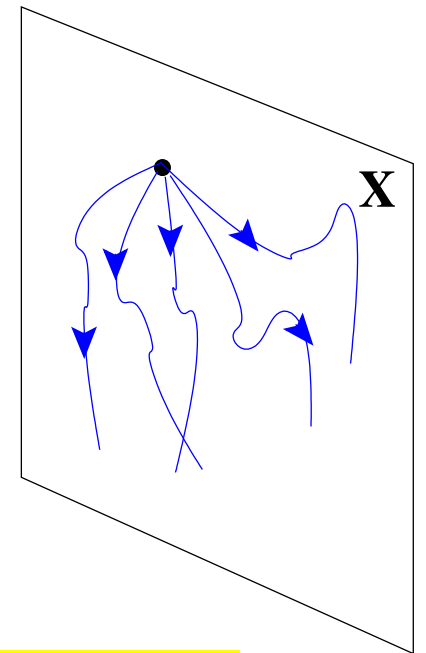


**Rudolf Kalman (1930- )**

## 'Axiomatization'

### State transition function:

$\phi(t, x, u)$  : state at time  $t$  from  $x$  using input  $u$ .



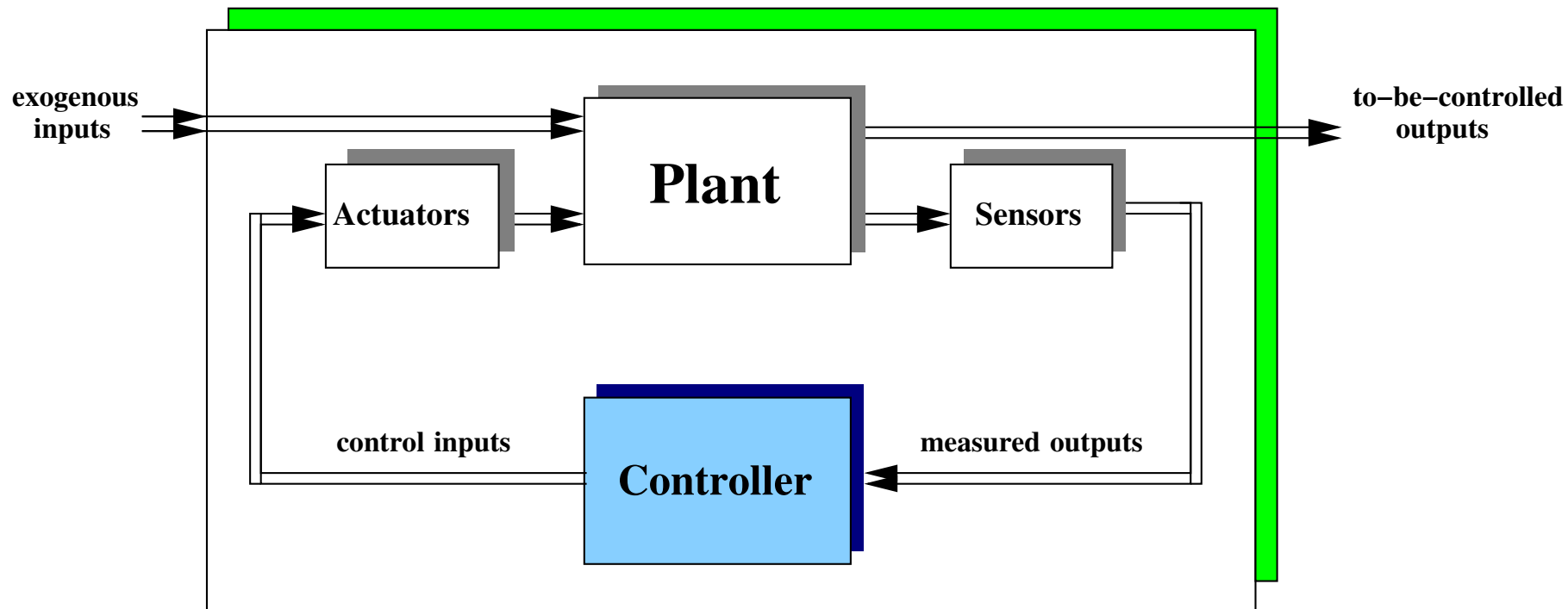
### Read-out function:

$g(x, u)$  : output with state  $x$  and input value  $u$ .



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

- for **control** (stabilization, robustness, ...)





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

- for **control** (stabilization, robustness, ...)
- **prediction** of one signal from another
- **system ID:** models from data
- understanding **system representations**  
(state, transfer f'n, etc.)
- etc., etc., etc.

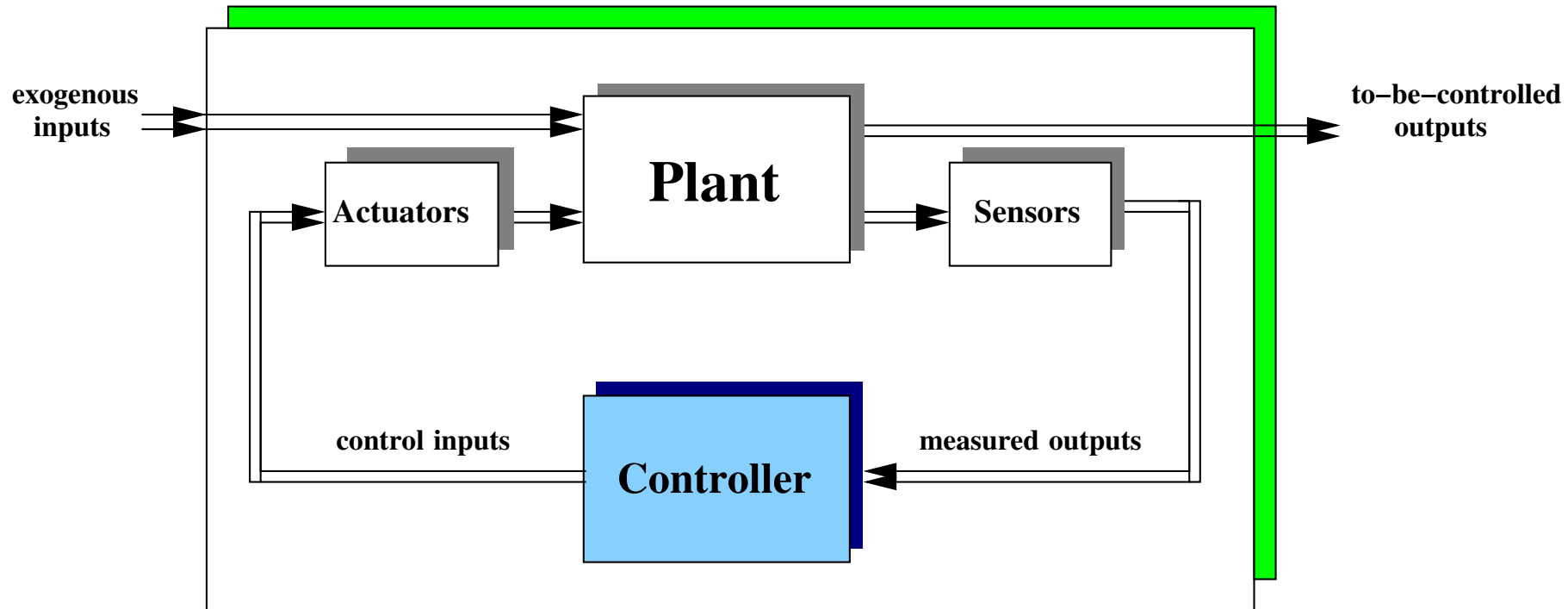


***Let's take a closer look at the i/o framework ...***

**in control (only)**

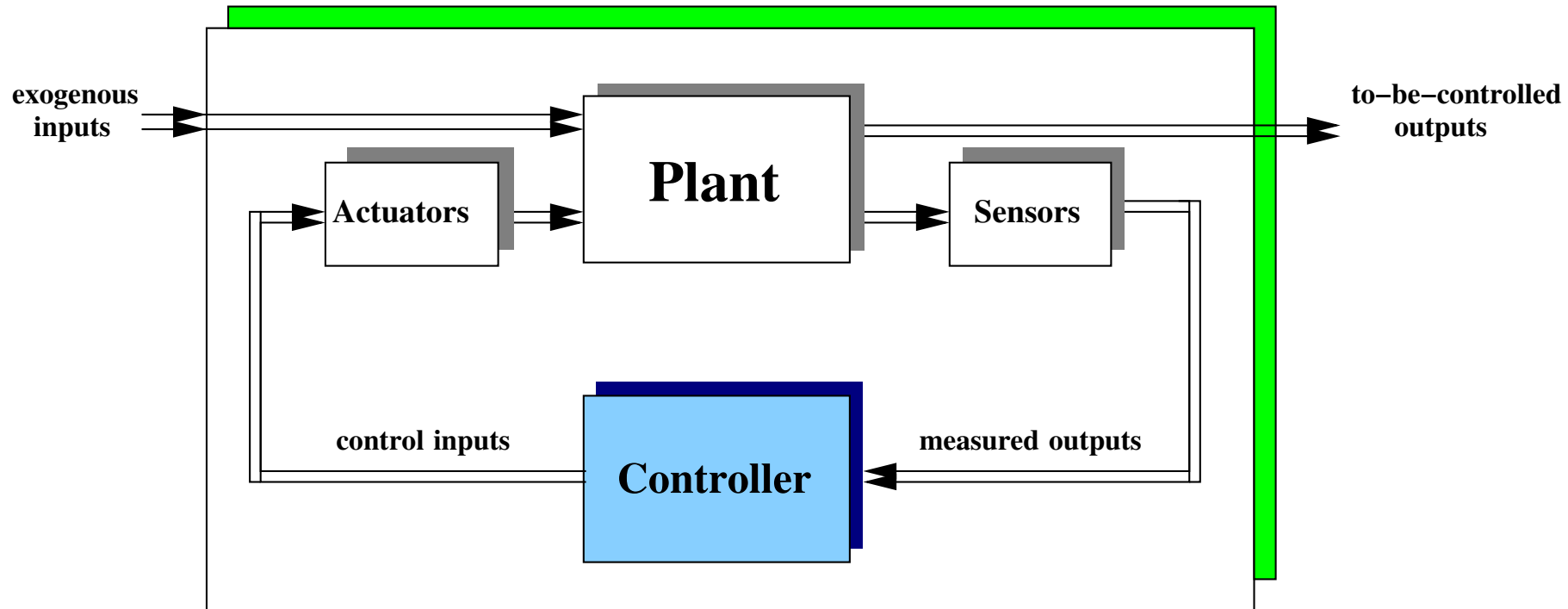
# Difficulties with i/o

## active control



# Difficulties with i/o

**active control**



**versus passive control**

## Difficulties with i/o

**active** control versus **passive** control

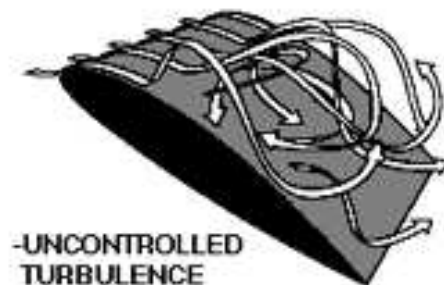
### Controlling turbulence

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



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

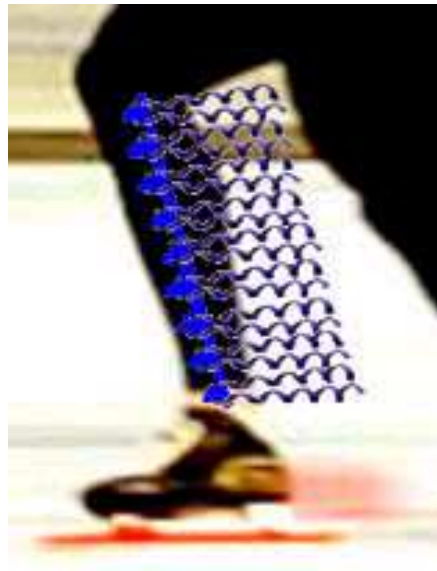
active control versus passive control

## Nagano 1998



**active** control versus **passive** control

Nagano 1998

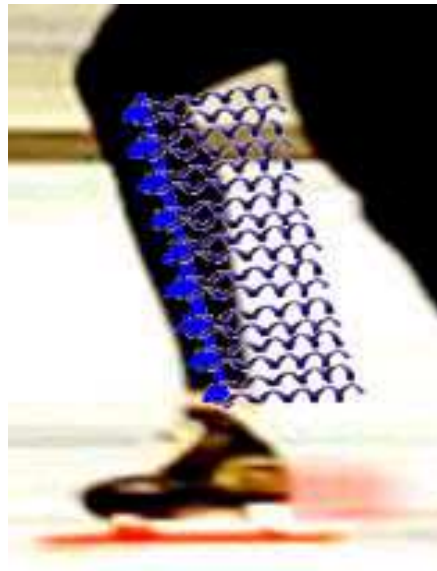


These are beautiful **controllers!**

## Difficulties with i/o

**active** control versus **passive** control

Nagano 1998

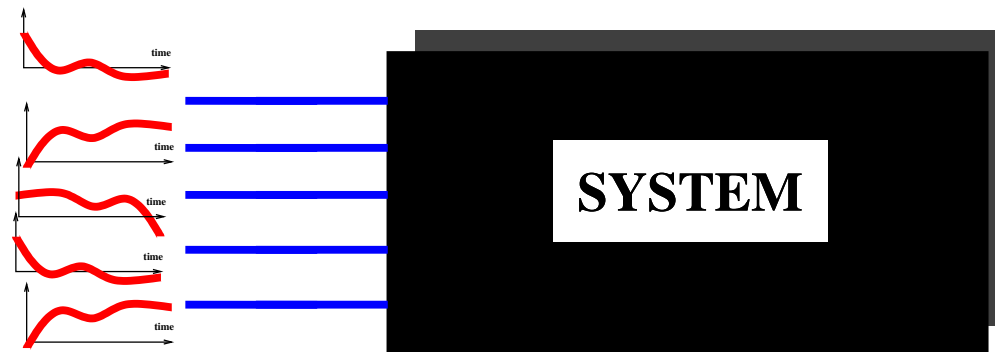


These are beautiful **controllers**! But, the only people not calling this "**control**", are the **control engineers** ...



***At last, a consistent framework ...***

# The behavior



**Which event trajectories are possible?**

**The behavior =**

**all trajectories of the system variables which, according to the mathematical model, are possible.**

**Definition: A system  $\Sigma$  is defined as**

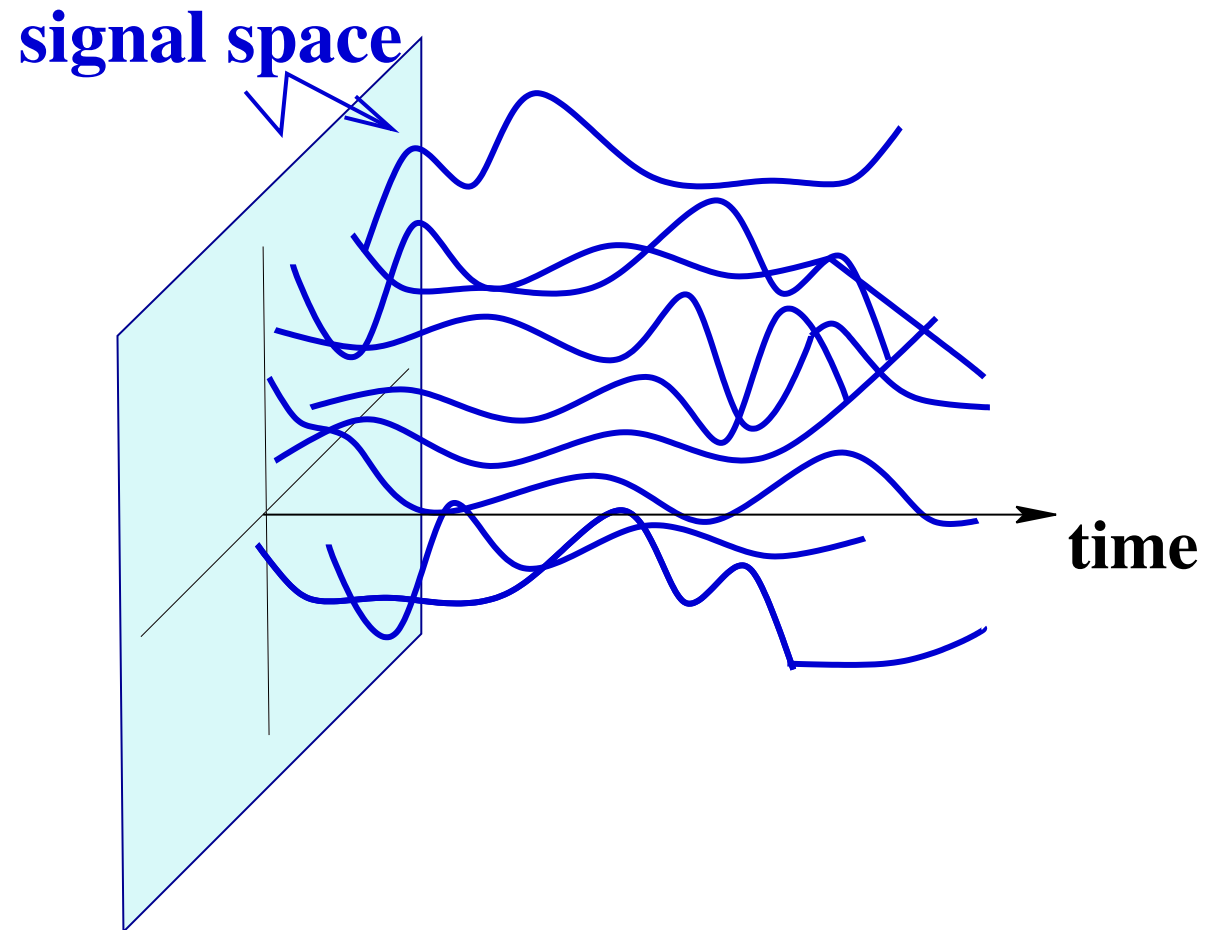
$$\Sigma = (\mathbb{T}, \mathbb{W}, \mathfrak{B})$$

**with  $\mathbb{T}$  = the set of independent variables**

**$\mathbb{W}$  = the signal space**

**$\mathfrak{B} \subseteq \mathbb{W}^{\mathbb{T}}$  the behavior.**

# The behavior



**Totality of 'legal' trajectories =: the behavior**



## Linear shift-invariant differential systems

There exists an extensive theory for these systems

$$\Sigma = (\mathbb{T}, \mathbb{W}, \mathfrak{B})$$

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

$\mathbb{W} = \mathbb{R}^w$ , the set of **dependent** variables,

$\mathfrak{B} =$  **sol'ns lin. const. coeff. system ODE's or PDE's.**

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$$\Sigma = (\mathbb{T}, \mathbb{W}, \mathfrak{B})$$

$\mathbb{T} = \mathbb{R}^n$ , the set of **independent** variables,  
often  $n = 1$  (dynamical systems)  
or  $n = 4$  (distributed systems),

$\mathbb{W} = \mathbb{R}^w$ , the set of **dependent** variables,

$\mathfrak{B} =$  **sol'ns lin. const. coeff. system ODE's or PDE's.**

## Linear shift-invariant differential systems

Let  $R \in \mathbb{R}^{\bullet \times w}[\xi_1, \dots, \xi_n]$ , and consider

$$R\left(\frac{\partial}{\partial x_1}, \dots, \frac{\partial}{\partial x_n}\right)w = 0. \quad (*)$$

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$$\mathcal{B} = \{w \in \mathcal{C}^\infty(\mathbb{R}^n, \mathbb{R}^w) \mid (*) \text{ holds}\}.$$

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Notation for  $n$ -D linear differential systems:

$$(\mathbb{R}^n, \mathbb{R}^w, \mathfrak{B}) \in \mathcal{L}_n^w, \quad \text{or} \quad \mathfrak{B} \in \mathcal{L}_n^w.$$

Examples: **Maxwell's eq'ns**, diff. 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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$\mathbb{T} = \mathbb{R} \times \mathbb{R}^3$  (time and space)  $n = 4$ ,

$w = (\vec{E}, \vec{B}, \vec{j}, \rho)$  (electric field, magnetic field,

current density, charge density),

$\mathbb{W} = \mathbb{R}^3 \times \mathbb{R}^3 \times \mathbb{R}^3 \times \mathbb{R}$ ,  $w = 10$ ,

$\mathfrak{B} \in \mathcal{L}_4^{10} =$  the set of solutions to these PDE's.

**Note:** 10 variables, 8 equations!  $\Rightarrow \exists$  free variables.

## Submodule theorem

$R \in \mathbb{R}^{\bullet \times \bullet}[\xi_1, \dots, \xi_n]$  defines

$\mathfrak{B} = \ker\left(R\left(\frac{\partial}{\partial x_1}, \dots, \frac{\partial}{\partial x_n}\right)\right)$ , but not vice-versa.

??  $\exists$  'intrinsic' characterization of  $\mathfrak{B} \in \mathcal{L}_n^W$  ??



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??  $\exists$  'intrinsic' characterization of  $\mathfrak{B} \in \mathcal{L}_n^w$  ??

Define the **annihilators** of  $\mathfrak{B} \in \mathcal{L}_n^w$  by

$$\mathfrak{N}_{\mathfrak{B}} := \left\{ n \in \mathbb{R}^w[\xi_1, \dots, \xi_n] \mid n^\top \left( \frac{\partial}{\partial x_1}, \dots, \frac{\partial}{\partial x_n} \right) \mathfrak{B} = 0 \right\}.$$

$\mathfrak{N}_{\mathfrak{B}}$  is a  $\mathbb{R}[\xi_1, \dots, \xi_n]$ -submodule of  $\mathbb{R}^w[\xi_1, \dots, \xi_n]$ .

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Thm. 1:

$$\mathcal{L}_n^w \xleftrightarrow{1:1} \text{submodules of } \mathbb{R}^w[\xi_1, \dots, \xi_n]$$

## Elimination theorem

Assume  $\mathcal{B} \in \mathcal{L}_n^{w_1 + w_2}$ , and define

$$\mathcal{B}_1 := \{w_1 \mid \exists w_2 \text{ such that } (w_1, w_2) \in \mathcal{B}\}$$

$$\mathcal{B}_1 \in \mathcal{L}_n^{w_1}?$$

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$$\mathcal{B}_1 \in \mathcal{L}_n^{w_1}?$$

Thm. 2 ('Elimination' thm):

**It does!**

## Elimination theorem

Which PDE's describe  $(\rho, \vec{E}, \vec{j})$  in Maxwell's equations ?

Eliminate  $\vec{B}$  from Maxwell's equations  $\rightsquigarrow$

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

## Controllability

$$R\left(\frac{\partial}{\partial x_1}, \dots, \frac{\partial}{\partial x_n}\right)w = 0$$

is a 'kernel representation' of the associated  $\mathfrak{B} \in \mathcal{L}_n^w$ .

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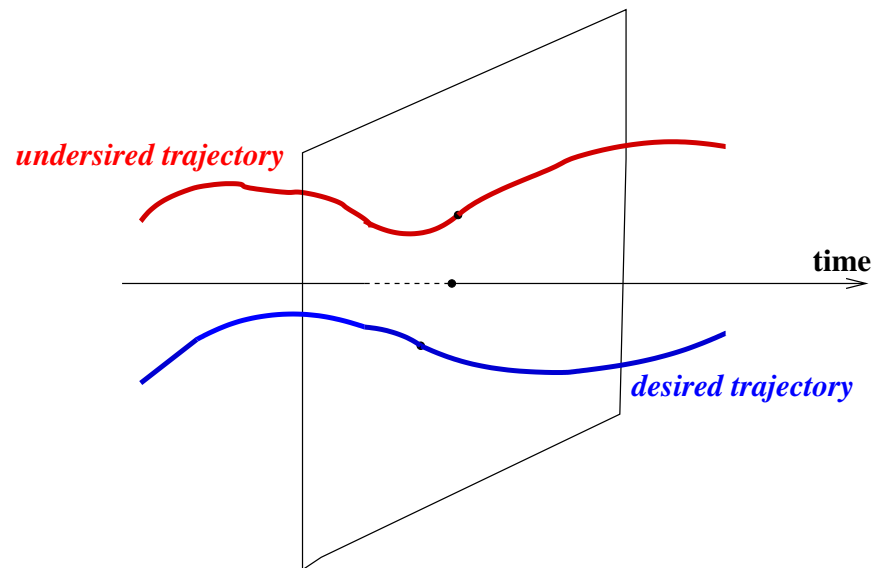
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**Thm. 3:  $\mathfrak{B}$  admits image repr.  $\Leftrightarrow$  it is ‘controllable’.**

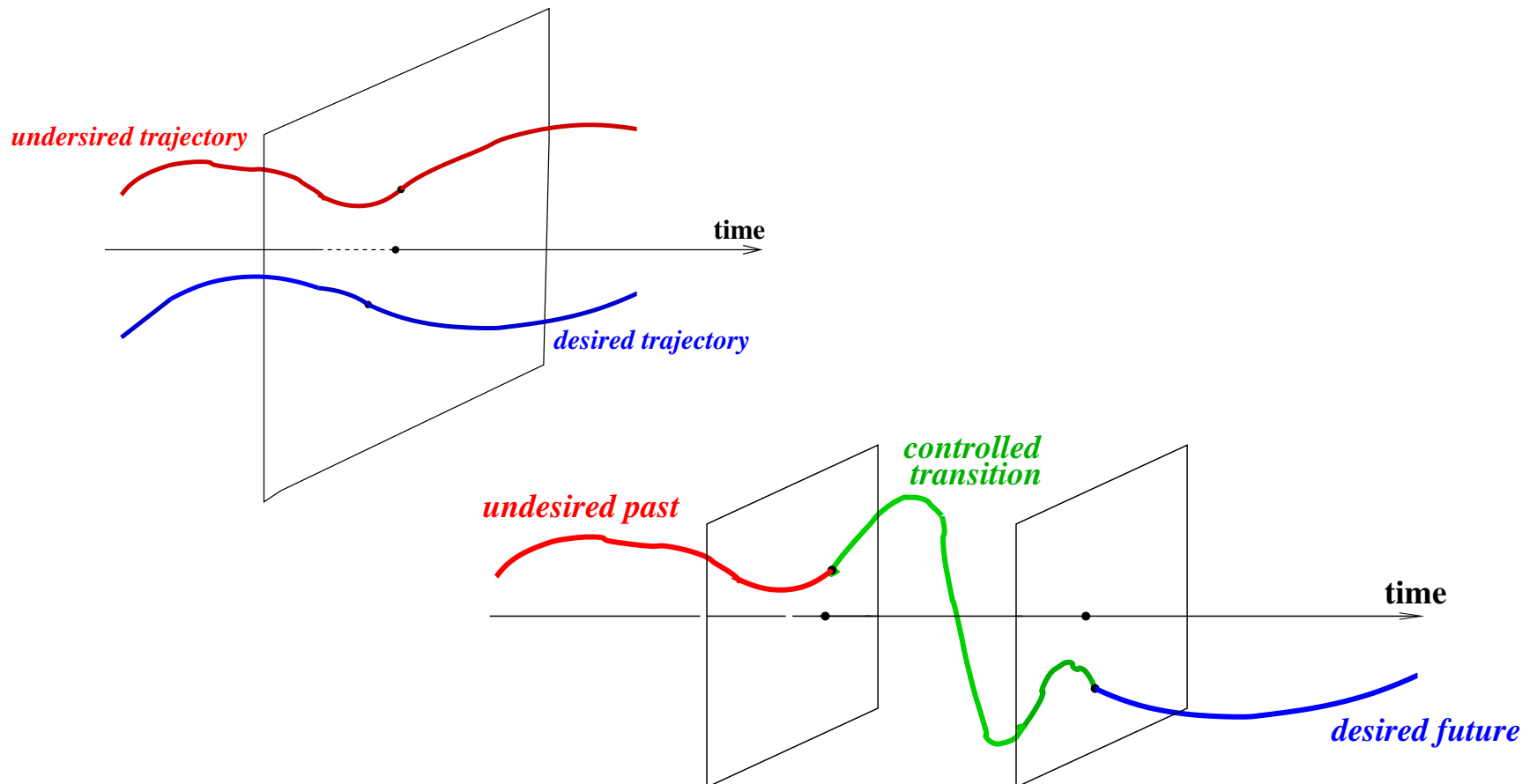
# Controllability for $n = 1$

Controllability def'n in pictures:



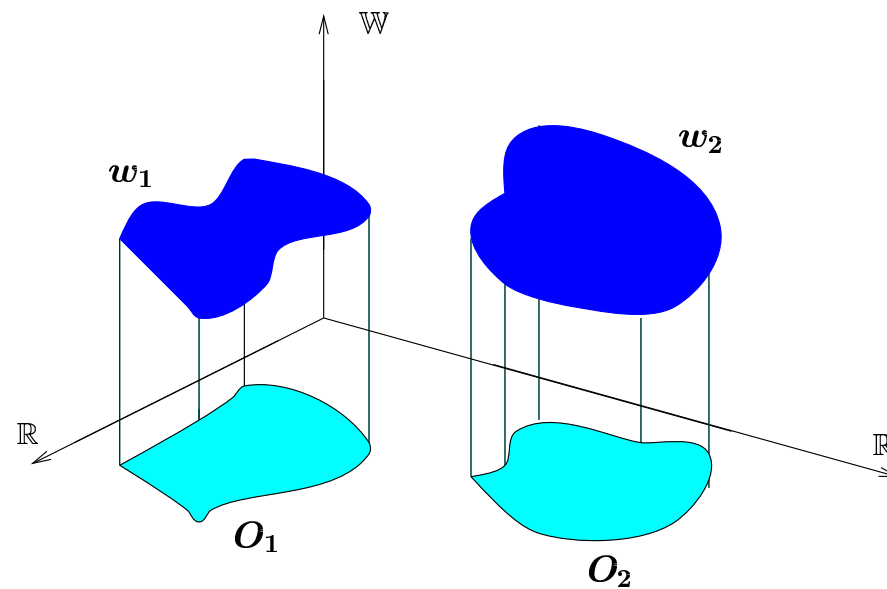
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# Controllability for PDE's

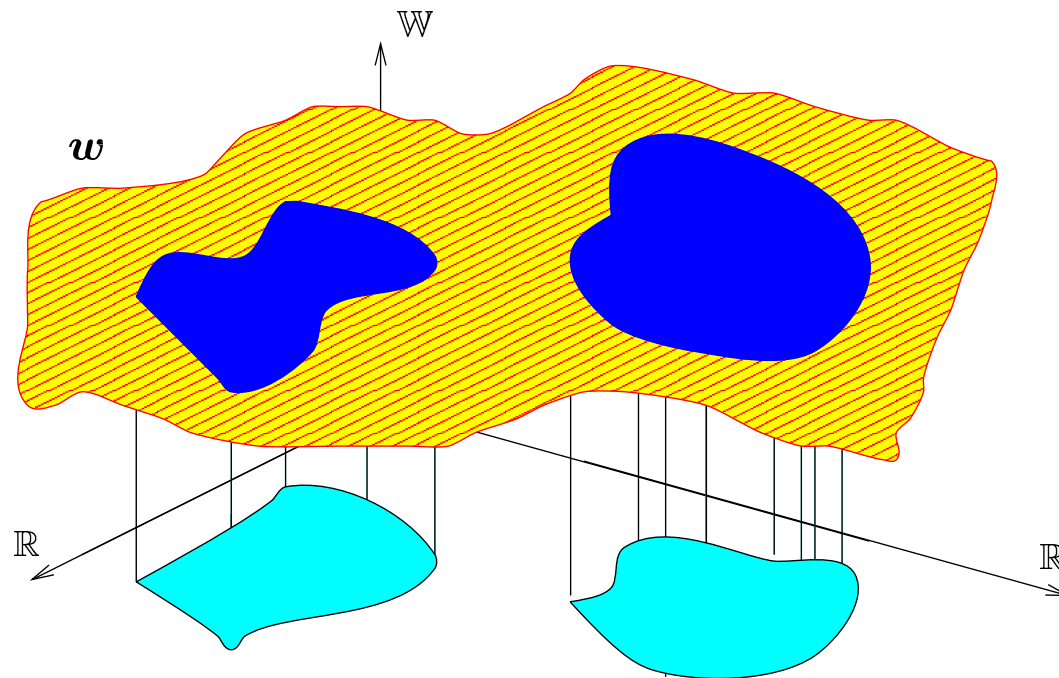
Controllability def'n in pictures:



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

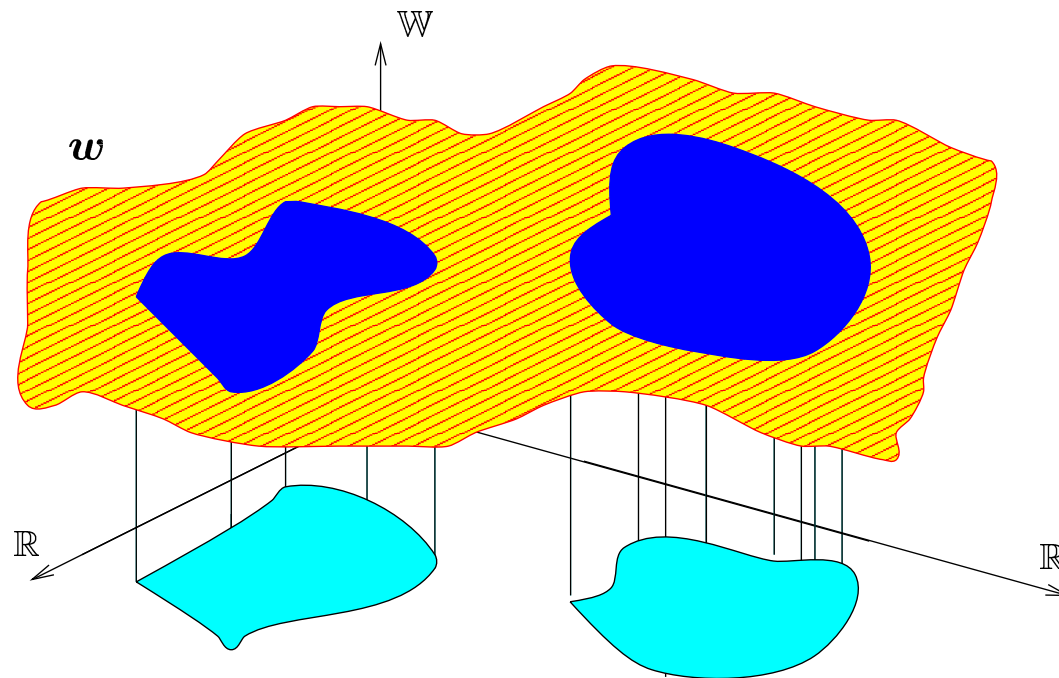
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**Controllability :  $\Leftrightarrow$  'patch-ability'.**



# Are Maxwell's equations controllable?

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The following equations in the *scalar potential*  $\phi$  and the *vector potential*  $\vec{A}$ , generate exactly the solutions to Maxwell's equations:

$$\vec{E} = -\frac{\partial}{\partial t}\vec{A} - \nabla\phi,$$

$$\vec{B} = \nabla \times \vec{A},$$

$$\vec{j} = \epsilon_0 \frac{\partial^2}{\partial t^2} \vec{A} - \epsilon_0 c^2 \nabla^2 \vec{A} + \epsilon_0 c^2 \nabla(\nabla \cdot \vec{A}) + \epsilon_0 \frac{\partial}{\partial t} \nabla \phi,$$

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proves controllability. Illustrates the connection

**controllability  $\Leftrightarrow \exists$  potential !**

**Observability** of the image representation

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$\ell$  can be deduced from  $w$ ,

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Not all controllable systems admit an **observable** image repr'ion. For  $n = 1$ , they do. For  $n > 1$ , exceptionally.

The latent variable in an image repr'ion may be **'hidden'**.

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Example: Maxwell's equations **do not** allow a potential representation that is **observable**.

**Dynamical systems (ODE's):  $\sim$  1985**

**2-D discrete set of ind. variables: Rocha  $\sim$  1990**

**Differential-delay systems:**

**Glüsing-Luerssen, Rocha, Zampieri, Vettori**

**PDE's: Shankar, Pillai, Oberst, Zerz  $\sim$  1995**

**Generalization from  $\mathbb{R}$ ,  $\mathbb{C}$  to quaternions:**

**Pereira, Vettori  $\sim$  2004**



**Thank you**

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

`Jan.Willems@esat.kuleuven.ac.be`

`http://www.esat.kuleuven.ac.be/~jwillems`