

# **DISSIPATIVE SYSTEMS:**

**Where do we stand?**

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**October 27, 2006**

**On the occasion of the 70-th birthday of**

**Gianni Marchesini**

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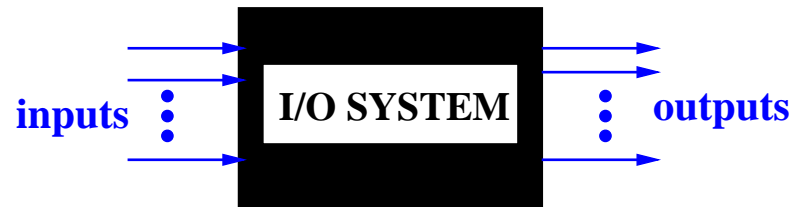


**Gianni Marchesini**

# **Dissipative systems**

# Open systems

**‘Open’ systems** are an appropriate starting point for the study of dynamics. For example,



~> **the dynamical system**

$$\Sigma: \quad \dot{\mathbf{x}} = f(\mathbf{x}, \mathbf{u}), \quad \mathbf{y} = h(\mathbf{x}, \mathbf{u}).$$

$\mathbf{u} \in \mathbf{U} = \mathbb{R}^m, \mathbf{y} \in \mathbf{Y} = \mathbb{R}^p, \mathbf{x} \in \mathbf{X} = \mathbb{R}^n$ : **input, output, state.**

**Behavior**  $\mathfrak{B} =$  **all sol'ns**  $(u, y, x) : \mathbb{R} \rightarrow \mathbf{U} \times \mathbf{Y} \times \mathbf{X}.$

## Dissipative dynamical systems

$$s : \mathbb{U} \times \mathbb{Y} \rightarrow \mathbb{R}$$

called the *supply rate*,

$$V : \mathbb{X} \rightarrow \mathbb{R}$$

called the *storage function*.

$\Sigma$  is said to be

*dissipative* w.r.t. the supply rate  $s$  and with storage  $V$   
if

$$\frac{d}{dt} V(x(\cdot)) \leq s(u(\cdot), y(\cdot))$$

for all  $(u, y, x) \in \mathfrak{B}$ .

## Dissipation inequality

$$\frac{d}{dt} V(x(\cdot)) \leq s(u(\cdot), y(\cdot))$$

for all  $(u, y, x) \in \mathfrak{B}$ .

This inequality is called the *dissipation inequality*.

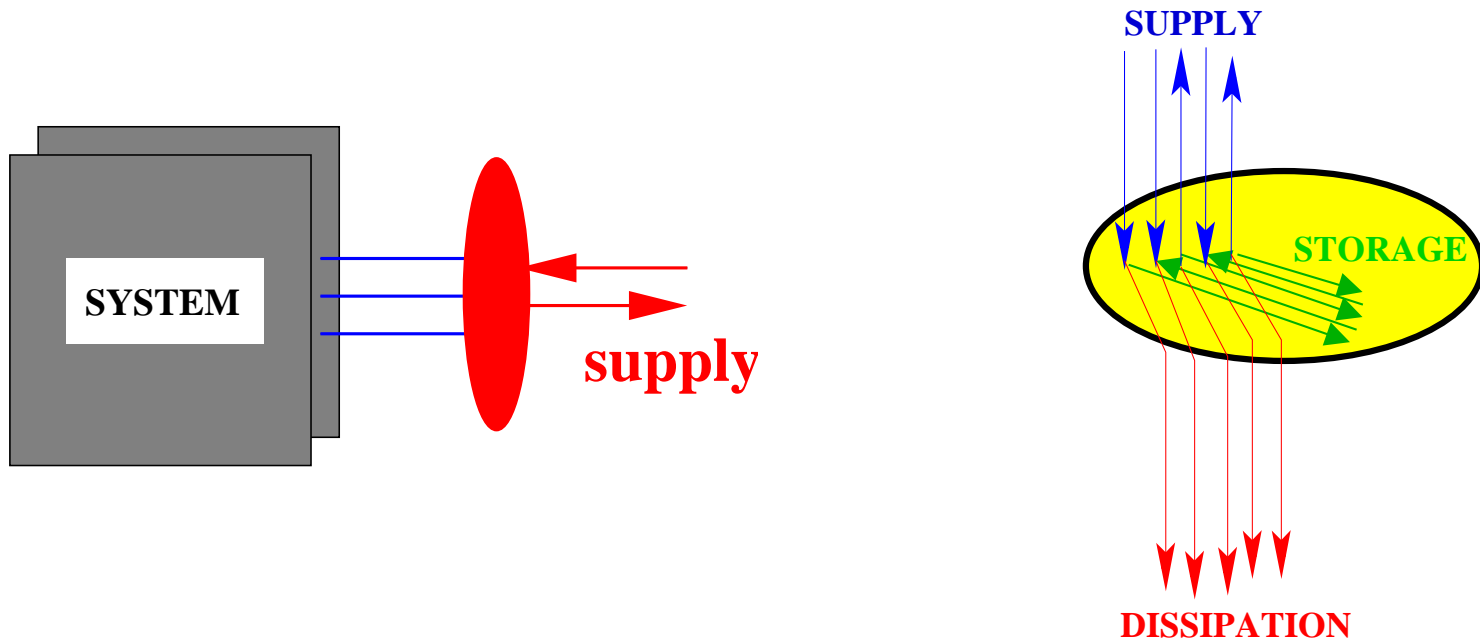
Equivalent to

$$\dot{V}^\Sigma(\mathbf{x}, \mathbf{u}) := \nabla V(\mathbf{x}) \cdot f(\mathbf{x}, \mathbf{u}) \leq s(\mathbf{x}, h(\mathbf{x}, \mathbf{u}))$$

for all  $(\mathbf{u}, \mathbf{x}) \in \mathbb{U} \times \mathbb{X}$ .

If equality holds: **‘conservative’** system.

# Dissipation inequality



$s(u, y)$  models something like the **power** delivered to the system when the input value is  $u$  and output value is  $y$ .

$V(x)$  then models the internally **stored energy**.

**Dissipativity**  $:\Leftrightarrow$

**rate of increase of internal energy  $\leq$  power delivered**



# Lyapunov function

Special case: 'closed' system:

$$\Sigma : \dot{x} = f(x) \quad \text{and} \quad s = 0$$

then dissipativity with  $V : \mathbb{X} \rightarrow \mathbb{R}$

$\rightsquigarrow$  *Lyapunov function*

$$\frac{d}{dt} V(x(\cdot)) \leq 0$$



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dissipativity  $\Leftrightarrow V$  is a Lyapunov function.

Dissipativity is the natural generalization to open systems of Lyapunov theory.

**Stability for closed systems  $\simeq$  Dissipativity for open systems.**

# The construction of storage functions

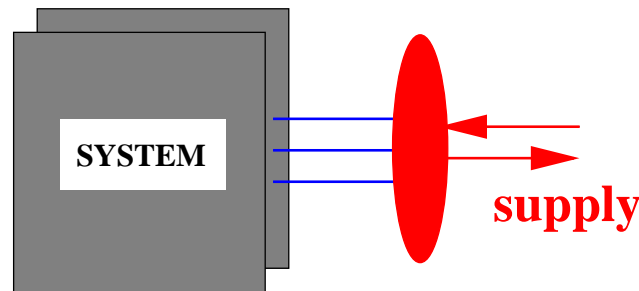
Basic question:

Given (a representation of )  $\Sigma$ , the dynamics,  
and given  $s$ , the supply rate,  
does there exist a storage function  $V$  such that  
the dissipation inequality holds?

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Monitor power in, known dynamics, what is the stored energy?

## The construction of storage functions

**The construction of storage functions is very well understood, particularly for finite dimensional linear systems and quadratic supply rates.**

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Leads to **LMI's**, **ARI**neq, **ARE**, robust control, ...

The storage function  $V$  is in general far from unique. There are two 'canonical' storage functions:

the **available storage** and the **required supply**.

For **conservative** systems,  $V$  is unique.

## From storage to LMI's

$$\Sigma : \frac{d}{dt}x = Ax + Bu, y = Cx + Du, \quad s(u, y) = \mathbf{quadratic}$$



## From storage to LMI's

$$\Sigma : \frac{d}{dt}x = Ax + Bu, y = Cx, \quad s(u, y) = \|u\|^2 - \|y\|^2$$

**If storage f'n exists, quadratic one exists**  $V(x) = \frac{1}{2}x^\top Kx$

**WLOG**  $K = K^\top$ , possibly  $K \geq 0$ .

$$\frac{d}{dt}V(x) \leq s(u, y) \rightsquigarrow \begin{bmatrix} A^\top K + AK + C^\top C & KB \\ B^\top K & -I \end{bmatrix} \leq 0$$

**solvable?**

$$\Leftrightarrow A^\top K + AK + KBB^\top K + C^\top C \leq 0 \quad \text{solvable?}$$

$$\Leftrightarrow A^\top K + AK + KBB^\top K + C^\top C = 0 \quad \text{solvable?}$$

**ARIneq, ARE, ...**

## From storage to LMI's

$$\begin{bmatrix} A^\top K + AK + C^\top C & KB \\ B^\top K & -I \end{bmatrix} \leq 0 \quad \text{and, possibly, } K \geq 0 \rightsquigarrow$$

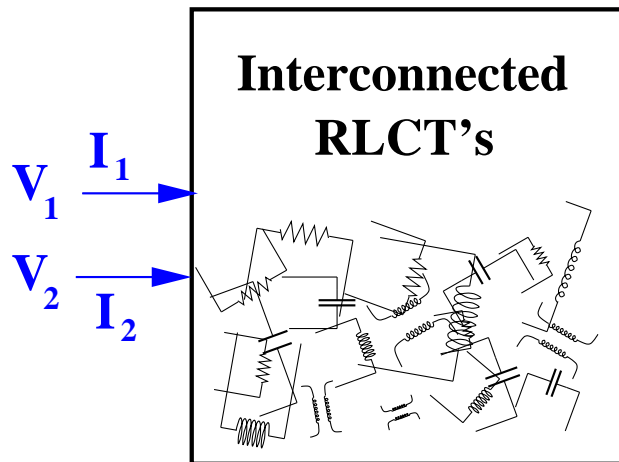
$$A_0 + x_1 A_1 + x_2 A_2 + \cdots + x_n A_n \geq 0 \quad \text{feasible?, etc.}$$

**LMI's, SDP, ...**

**How good is this notion?**

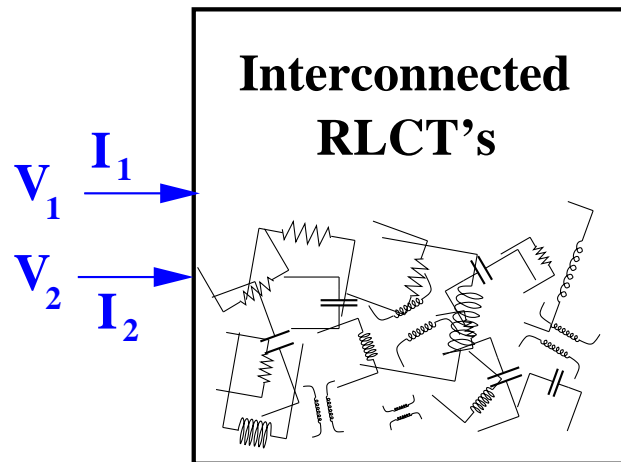
# Circuit synthesis

Is  $G \in \mathbb{R}(\xi)$  **realizable** as the driving point impedance of an electrical circuit containing (positive) resistors, capacitors, inductors, and transformers?



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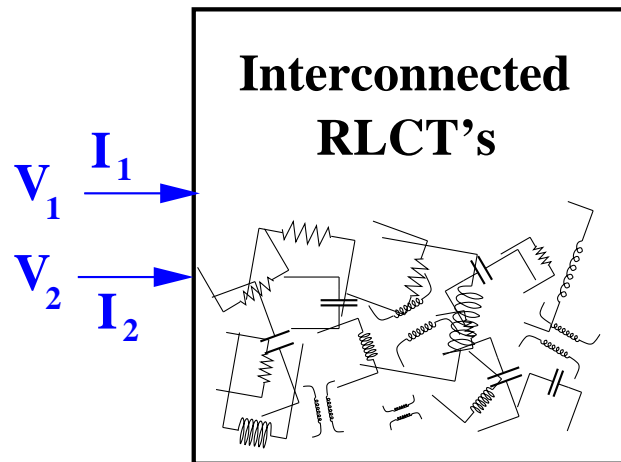
**Iff  $G$  is 'positive real'**

$$[\operatorname{Re}(s) > 0 \Rightarrow \operatorname{Re}(G(s)) > 0]$$

**Otto Brune, 1932**

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$$[\operatorname{Re}(s) > 0 \Rightarrow \operatorname{Re}(G(s)) > 0]$$

Trafos **not** needed

Otto Brune, 1932

Raoul Bott & Richard Duffin, 1949

## Circuit synthesis

**Central idea of proof, using storage functions:**

**Let  $\frac{d}{dt}x = Ax + Bu$ ,  $y = Cx + Du$  be a minimal realization of  $G$ .**

**$G$  p.r.  $\Leftrightarrow$  dissipative w.r.t.  $u^\top y$ , storage f'n  $\frac{1}{2}x^\top Kx$ ,  $K = K^\top > 0$ .**

**Choice of basis  $\Rightarrow K = I$ .  $\leadsto \frac{d}{dt}\frac{1}{2}x^\top x \leq u^\top y \Leftrightarrow$**

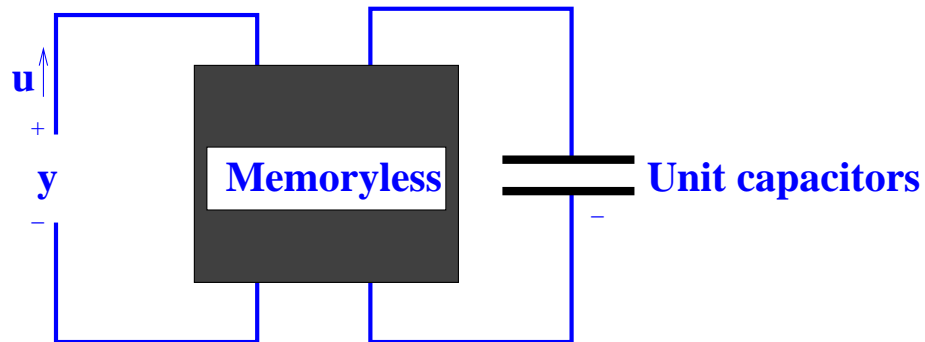
$$\begin{bmatrix} -A & -B \\ C & D \end{bmatrix} + \begin{bmatrix} -A & -B \\ C & D \end{bmatrix}^\top \geq 0$$

# Circuit synthesis

Central idea of proof, using storage functions:

Now, interconnect  $\begin{bmatrix} V \\ y \end{bmatrix} = \begin{bmatrix} -A & -B \\ C & D \end{bmatrix} \begin{bmatrix} I \\ u \end{bmatrix}$  with  $\frac{d}{dt}I = -V$

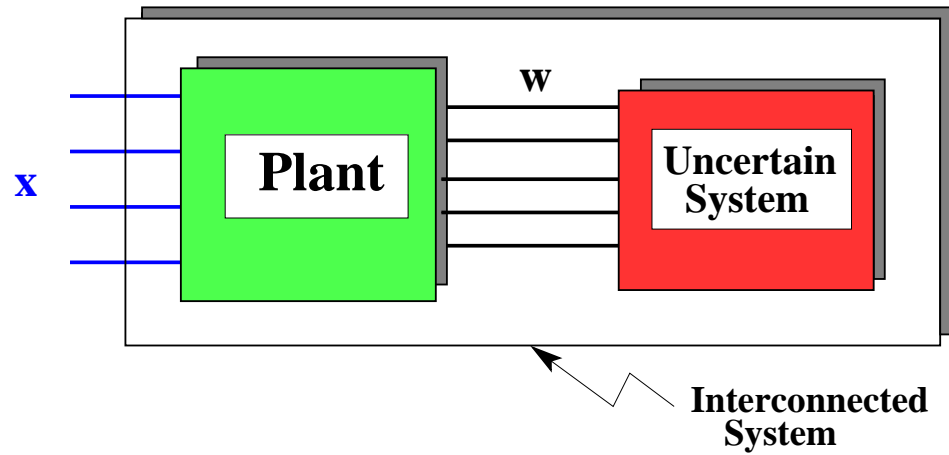
The storage f'n and the LMI takes the dynamics out.  
Terminate a memoryless system with unit capacitors.



Enforce reciprocity, etc.

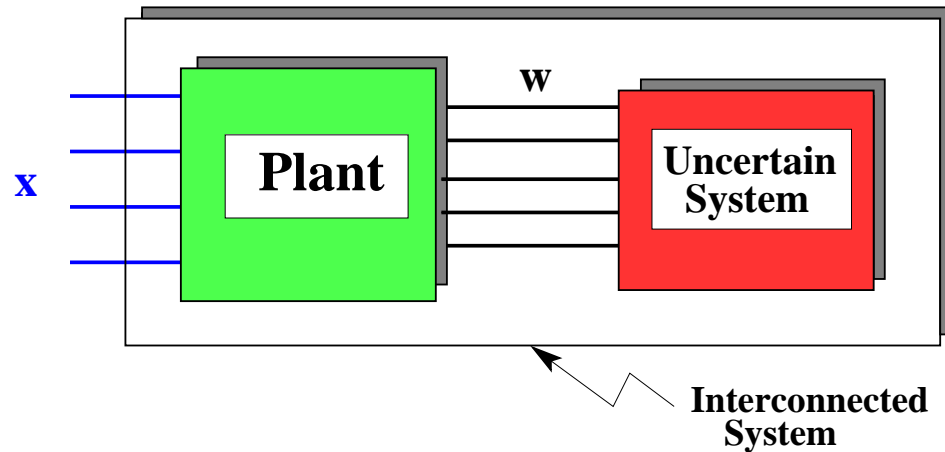


# Stability of dissipative interconnections

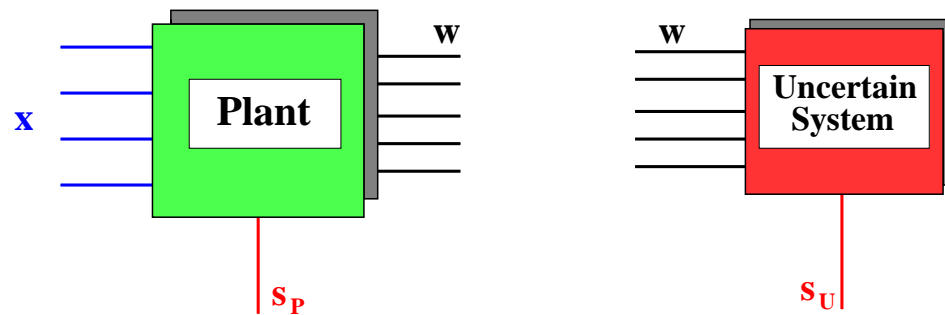


**Is this uncertain system stable?**

# Stability of dissipative interconnections



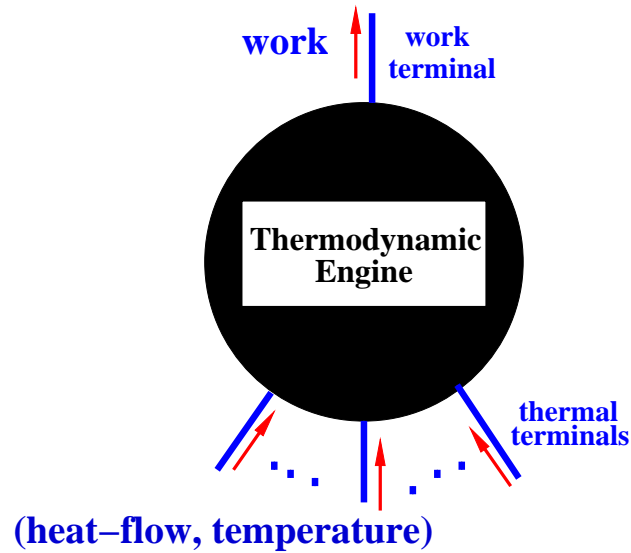
Is this uncertain system stable?



Yes, if both systems are dissipative and  $s_P + s_U = 0$

$\leadsto$  Lyapunov f'n = sum of storage f'ns.  $\Rightarrow$  stability.  
This requires the state, also for the uncertain system.

# Thermodynamics



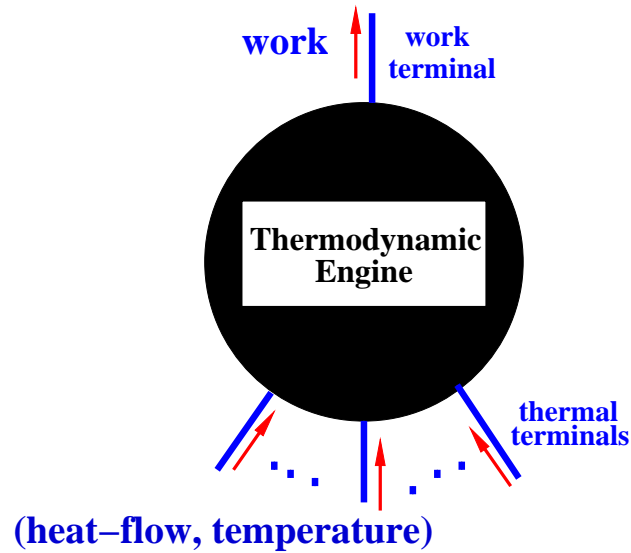
**Conservative w.r.t.**

$$- \text{work} + \sum_{\text{heat terminals}} \text{heat flow}$$

**Dissipative w.r.t.**

$$- \sum_{\text{heat terminals}} \frac{\text{heat flow}}{\text{temperature}}$$

# Thermodynamics



**Conservative w.r.t.**  $- work + \sum_{heat\ terminals} heat\ flow$

**Dissipative w.r.t.**  $-\sum_{heat\ terminals} \frac{heat\ flow}{temperature}$

**Input/output setting is hopeless!**

# **Back to basics**

## Behaviors

***Dynamical system:***  $\Sigma = (\mathbb{T}, \mathbb{W}, \mathfrak{B})$ , with  $\mathbb{T} \subseteq \mathbb{R}$  the **time-set**,  $\mathbb{W}$  the **signal space**, and  $\mathfrak{B} \subseteq \mathbb{W}^{\mathbb{T}}$  the **behavior**.

***Latent variable dynamical system*** is a refinement, with behavior represented with the aid of ***latent variables***.

$\Sigma_L = (\mathbb{T}, \mathbb{W}, \mathbb{L}, \mathfrak{B}_{\text{full}})$  with  $\mathbb{L}$  the **space of latent variables**, and  $\mathfrak{B}_{\text{full}} \subseteq (\mathbb{W} \times \mathbb{L})^{\mathbb{T}}$  the **full behavior**.

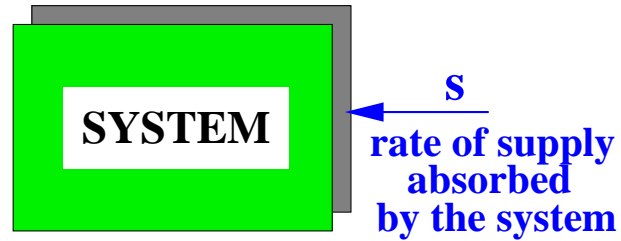
$\Sigma_L$  induces  $\Sigma = (\mathbb{T}, \mathbb{W}, \mathfrak{B})$  with ***manifest behavior***

$$\mathfrak{B} = \left\{ w : \mathbb{T} \rightarrow \mathbb{W} \mid \exists \ell : \mathbb{T} \rightarrow \mathbb{L} \text{ such that } (w, \ell) \in \mathfrak{B}_{\text{full}} \right\}.$$

**Example:**  $\frac{d}{dt}\ell = A\ell + Bu, \quad y = C\ell + Du.$

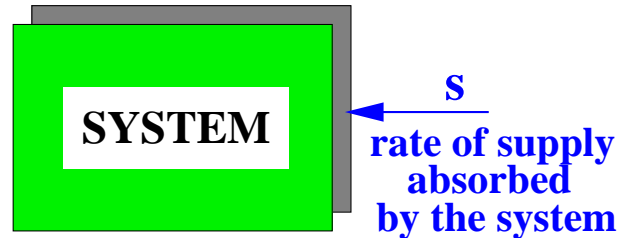
**The behavior is all there is**. Linearity, time-invariance, ...

# Dissipativity & Behaviors



**Dissipativeness restricts the way supply goes in and out .**

# Dissipativity & Behaviors



Dissipativeness restricts the way **supply goes in and out**.

$\Sigma = (\mathbb{R}, \mathbb{R}, \mathfrak{B})$  dynamical system.

$s : \mathbb{R} \rightarrow \mathbb{R}, s \in \mathfrak{B}$ , models rate of supply *absorbed*.

$\Sigma_L = (\mathbb{R}, \mathbb{R}, \mathbb{R}, \mathfrak{B}_{\text{full}})$  a latent variable representation.

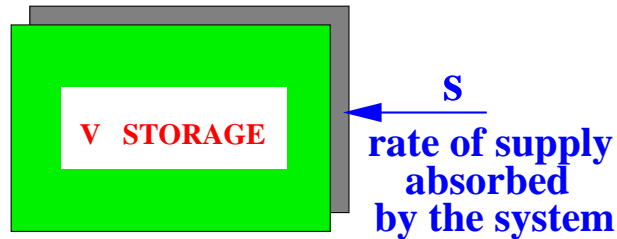
$(s, V) \in \mathfrak{B}_{\text{full}}, V : \mathbb{R} \rightarrow \mathbb{R}$  models the supply *stored*.



## Dissipativity & Behaviors

$V$  is said to be a *storage* if  $\forall (s, V) \in \mathfrak{B}_{\text{full}}$  and  $\forall t_0 \leq t_1$ , the *dissipation inequality* holds

$$V(t_1) - V(t_0) \leq \int_{t_0}^{t_1} s(t) dt$$



$\Sigma = (\mathbb{R}, \mathbb{R}, \mathfrak{B})$ , time-invariant, is said to be **dissipative** if there exists  $\Sigma_L = (\mathbb{R}, \mathbb{R}, \mathbb{R}, \mathfrak{B}_{\text{full}})$ , time-invariant, such that the dissipation inequality holds.

## Nonnegative storage

Simple existence result for non-negative storage functions.

### THEOREM

$\Sigma$  is *dissipative with non-negative storage*  $\Leftrightarrow$

$\forall s \in \mathfrak{B}$  and  $\forall t_0 \in \mathbb{R}, \exists K \in \mathbb{R},$

such that  $-\int_{t_0}^T s(t) dt \leq K$  for  $T \geq t_0$

‘Available storage’ is finite. N.a.s.c.!

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‘Available storage’ is finite. N.a.s.c.!

A n.a.s.c. for the existence of  $\mathfrak{B}_{\text{full}}$  and  $V$  (in terms of  $\mathfrak{B}$ ) is ?  
 $\exists$  sufficient conditions in terms of periodic trajectories  
assuming *observability* of  $V$  from  $s$ .

# Quadratic supply rates

## QDF's

A *quadratic differential form (QDF)* is a quadratic expression in the components of  $w \in \mathcal{C}^\infty(\mathbb{R}, \mathbb{R}^w)$  and its derivatives:

$$\sum_{\mathbf{k}, \ell} \left( \frac{d^{\mathbf{k}}}{dt^{\mathbf{k}}} w \right)^\top \Phi_{\mathbf{k}, \ell} \left( \frac{d^\ell}{dt^\ell} w \right)$$

with the  $\Phi_{\mathbf{k}, \ell} \in \mathbb{R}^{w \times w}$ . Map from  $\mathcal{C}^\infty(\mathbb{R}, \mathbb{R}^w)$  to  $\mathcal{C}^\infty(\mathbb{R}, \mathbb{R})$ .  
Compact notation and a convenient calculus.

$$\Phi(\zeta, \eta) = \sum_{\mathbf{k}, \ell} \Phi_{\mathbf{k}, \ell} \zeta^{\mathbf{k}} \eta^\ell$$

Notation QDF  $Q_\Phi(w)$ .

$Q_\Phi$  is said to be *non-negative* (denoted  $Q_\Phi \geq 0$ ) : $\Leftrightarrow$   
 $Q_\Phi(w) \geq 0$  for all  $w \in \mathcal{C}^\infty(\mathbb{R}, \mathbb{R}^w)$ .

## Dissipativity of QDF's

The system  $\Sigma_{\Phi} = (\mathbb{R}, \mathbb{R}, \text{im}(Q_{\Phi}))$  : supply rate is QDF.

Quite general, 'LQ':

1. Linear time-invariant differential system

$$R \left( \frac{d}{dt} \right) w = 0$$

perhaps including latent variables.

2. Controllable (in the behavioral sense: patchability).
3. QDF for the supply rate.

Extendable to rat. f'ns, both in system eq'ns and supply rate.

Examples: linear circuits, t'f f'n with supply rate quadratic form in input and output, linear mechanical systems, ...

## Dissipativity of $\Sigma_\Phi = (\mathbb{R}, \mathbb{R}, \text{im}(Q_\Phi))$

**6 statements concerning a supply rate defined by a QDF.**

- (i)  $\Sigma_\Phi$  is dissipative ( $\exists$  storage)**
- (ii)  $\Sigma_\Phi$  admits a ... with a QDF as storage**
- (iii)  $\Sigma_\Phi$  admits a ... with a memoryless state f'n as storage**
- (iv)  $\Sigma_\Phi$  admits a ... with a m'ess quadr. state f'n as storage**
- (v)  $\int_{-\infty}^{+\infty} Q_\Phi(w) dt \geq 0 \quad \forall w \in \mathcal{C}^\infty(\mathbb{R}, \mathbb{R}^w)$  compact support**
- (vi)  $\Phi(i\omega, -i\omega) + \Phi^\top(-i\omega, i\omega) \geq 0 \quad \forall \omega \in \mathbb{R}$**

$$\boxed{\text{(i)} \Leftarrow \text{(ii)} \Leftrightarrow \text{(iii)} \Leftrightarrow \text{(iv)} \Leftrightarrow \text{(v)} \Leftrightarrow \text{(vi)}}$$

**Under certain 'signature conditions'  $\text{(i)} \Leftrightarrow \text{(ii)}$ .**

## Dissipativity of $\Sigma_\Phi = (\mathbb{R}, \mathbb{R}, \text{im}(Q_\Phi))$

With a non-negative storage function, we obtain instead

- (i) Available storage for  $\Sigma_\Phi$  is finite
- (ii)  $\Sigma_\Phi$  admits a latent var. with non-negative storage
- (iii)  $\Sigma_\Phi$  ... with a non-negative QDF as storage
- (iv)  $\Sigma_\Phi$  ... with a  $\geq 0$  memoryless state f'n as storage
- (v)  $\Sigma_\Phi$  ... with a  $\geq 0$  ... quadr. state f'n as storage
- (vi)  $\int_{-\infty}^0 Q_\Phi(w) dt \geq 0 \quad \forall w \in \mathcal{C}^\infty(\mathbb{R}, \mathbb{R}^w)$  of compact support
- (vii) RHP frequency-domain & Pick matrix condition on  $\Phi$

$$\boxed{\text{(i)} \Leftrightarrow \text{(ii)} \Leftrightarrow \text{(iii)} \Leftrightarrow \text{(iv)} \Leftrightarrow \text{(v)} \Leftrightarrow \text{(vi)} \Leftrightarrow \text{(vii)}}$$

Under certain 'signature conditions'  $\text{(ii)} \Leftrightarrow \text{(iii)}$ .



## Dissipativity of $\Sigma_{\Phi} = (\mathbb{R}, \mathbb{R}, \text{im}(Q_{\Phi}))$

**The existence of a QDF as storage is an LMI.**

$\Phi \in \mathbb{R}^{w \times w}[\zeta, \eta]$  is given,  $\Psi \in \mathbb{R}^{w \times w}[\zeta, \eta]$  is unknown.

$$\frac{d}{dt} Q_{\Psi}(w) \leq Q_{\Phi}(w) \quad \forall w \in \mathcal{C}^{\infty}(\mathbb{R}, \mathbb{R}^w)$$



$$(\zeta + \eta)\Psi(\zeta, \eta) \leq \Phi(\zeta, \eta)$$

**Remains LMI if  $\Psi \geq 0$  is added.**

**In 1-D case storage f'n of  $w$  'observability'.**

**Not so in n-D case, as Maxwell's eq'ns.**

# **Some open problems**

## Intrinsic characterization of dissipativity

Let  $\Sigma = (\mathbb{R}, \mathbb{R}, \mathfrak{B})$  be time-invariant. **When is it dissipative?**

**I.e., when does there exist a time-invariant latent variable representation  $\Sigma_L = (\mathbb{R}, \mathbb{R}, \mathbb{R}, \mathfrak{B}_{\text{full}})$ , time-invariant, such that the dissipation inequality holds?**

**$\exists$  sufficient conditions in terms of periodic behavior, controllability, observability, equilibrium points, ...**

## Characterization of QDF's

Given  $\mathfrak{B} \subseteq \mathcal{C}^\infty(\mathbb{R}, \mathbb{R})$ , shift-invariant.

When does  $\exists \Phi \in \mathbb{R}^{w \times w}[\zeta, \eta]$  such that  $\mathfrak{B} = \text{image}(Q_\Phi)$ ?

# Characterization of positive storage f'ns for QDF's

## Conjecture:

The following are equivalent for  $\Phi \in \mathbb{R}^{w \times w} [\zeta, \eta]$ :

1.  $\int_{-\infty}^0 Q_{\Phi}(w) dt \geq 0 \quad \forall w \in \mathcal{C}^{\infty}(\mathbb{R}, \mathbb{R}^w)$  **of compact support,**
2.  $\forall w \in \mathcal{C}^{\infty}(\mathbb{R}, \mathbb{R}^w), \exists K \in \mathbb{R},$   
**such that**  $-\int_0^T Q_{\Phi}(w) dt \leq K \quad \forall T \geq 0.$

1.  $\Rightarrow$  2. is easy.

# Characterization of quadratic storage functions

Conjecture:

**A QDF has a storage iff it has a QDF as a storage**

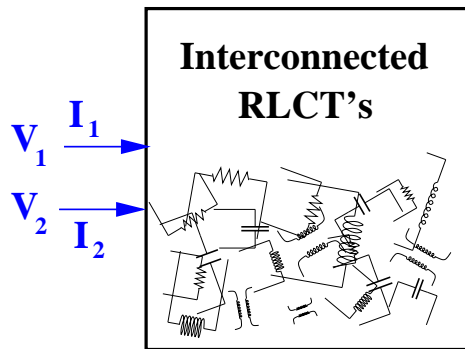
**Without signature conditions (as small gain, positive operator, conicity).**

# Passive behavior synthesis

Stated for single input/single output systems. Consider

$$p\left(\frac{d}{dt}\right)V = q\left(\frac{d}{dt}\right)I.$$

When realizable as **behavior** of the port var. of a circuit with (positive) resistors, capacitors, inductors, and transformers?



Necessary:  $\frac{p}{q}$  p.r. p.r. n.a.s.c. when  $p$  and  $q$  co-prime.

What conditions does dissipativity impose on common factors?

## **Transformerless synthesis**

**Bott-Duffin synthesis realizes the impedance, not the behavior. They do not use minimal realization, common factors are introduced. Uncontrollable parts are added in the behavior.**

**Is a synthesizable SISO behavior ... without transformers?**

**Suspect: NOT.**

**Transformerless synthesis of behaviors more open than ever.**



## Conclusion

**Let us get the physics right!**

**The rest is mathematics**

**Also for dissipative systems, this means backing off from input/output thinking!**

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**Prima la fisica, poi la matematica**

**Thank you for your attention**

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**&**

**Happy Birthday, Gianni**

