



# Interaction variables–based modeling and simulations of energy dynamics\*

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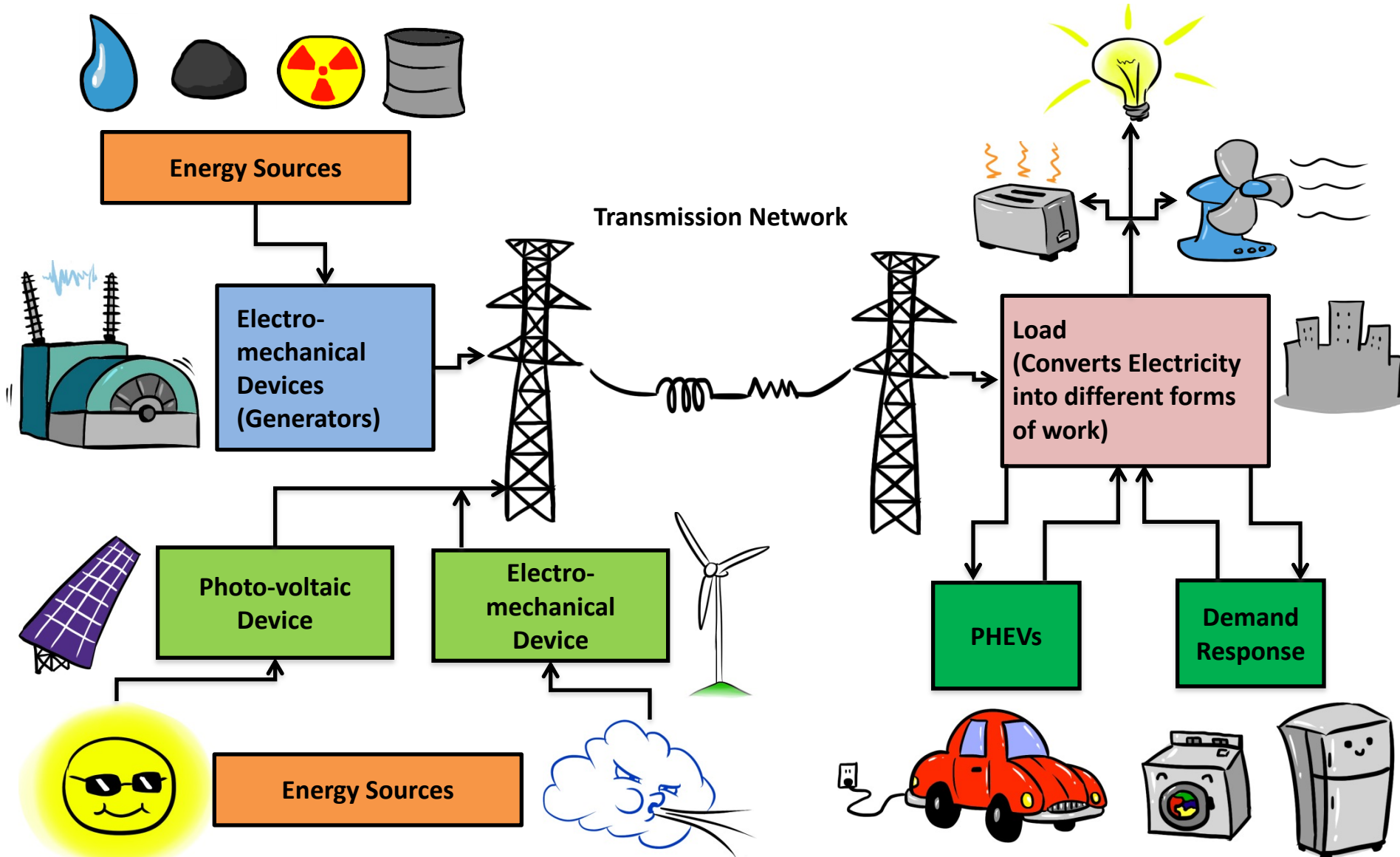
\*Based on the upcoming chapter Marija Ilic, *Interaction Variables-based Modelling and Control of Energy Dynamics*, in *Springer Nature, Women in Power: Research and Development Advances in Electric Power Systems*, Editors: Jill S. Tietjen, [Marija D. Ilic](#), [Lina Bertling Tjernberg](#), [Noel N. Schulz](#), June 2023, <https://link.springer.com/book/9783031297236>



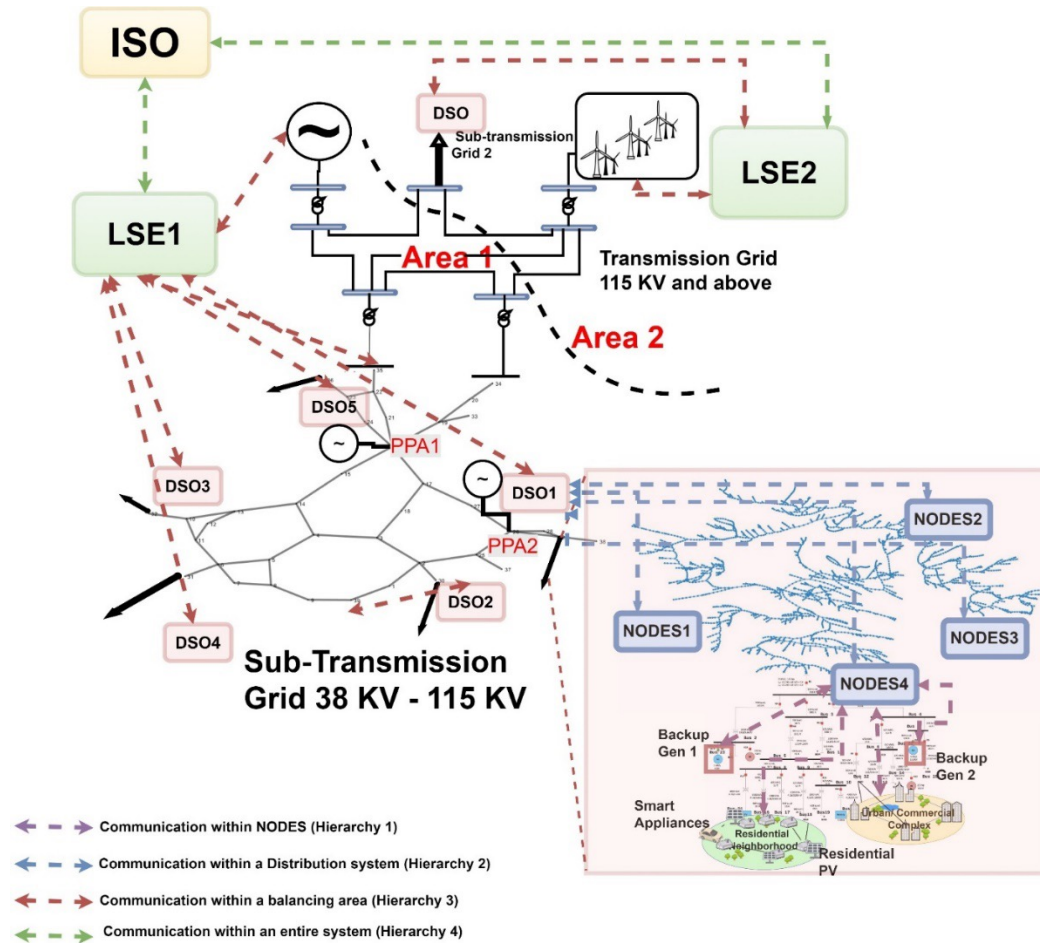
# Outline

- ❖ Spatial, temporal complexity, new diverse technologies
- ❖ Emerging fundamental modeling, simulation and control needs
- ❖ **Challenges** (new multi-layered SCADA-DyMonDS; minimal information exchange for managing temporal and spatial complexity)
- ❖ **Opportunities:** Systematic interaction variables- based energy dynamics; unified energy dynamics
  - Early concept of interaction variables
  - General concept (no P-Q decoupling, no linearization)
- ❖ Interactive optimization problem formulation in energy space
- ❖ Digital twin which might work

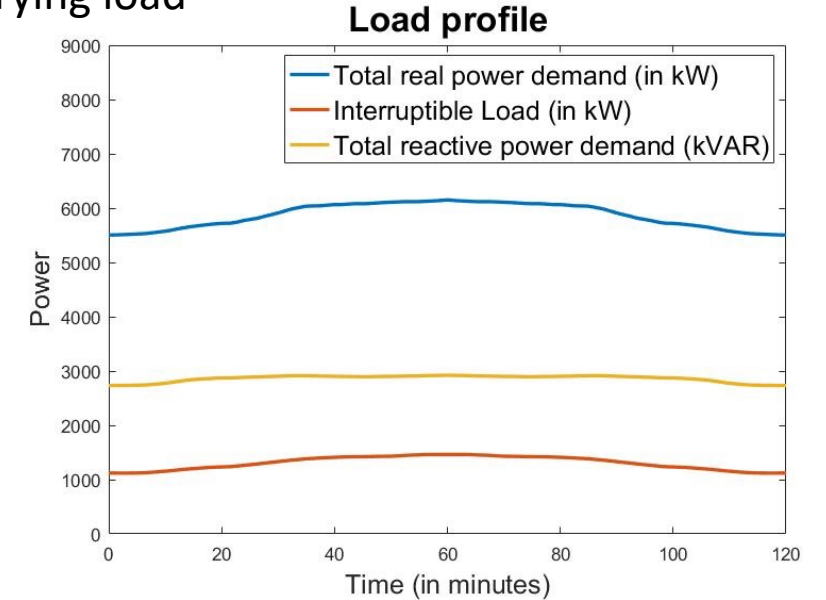
# Future Power Systems-Diverse Physics



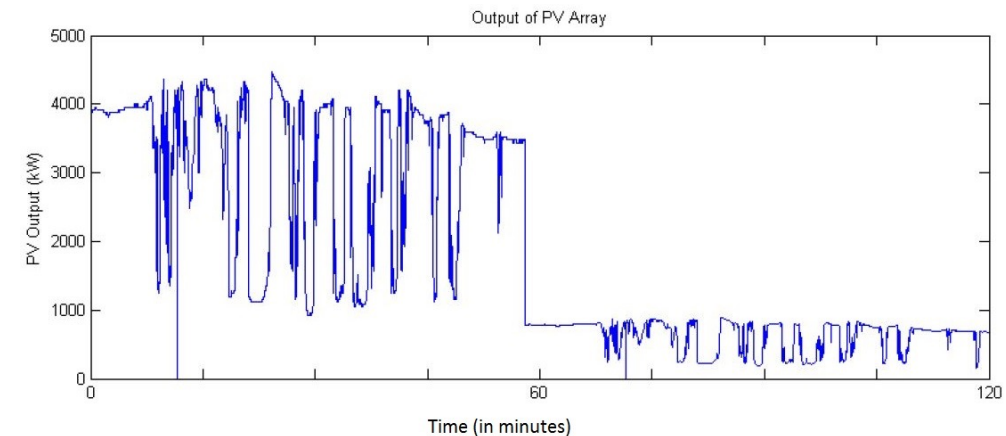
# Temporal and spatial interactions across stakeholders



Slow-varying load



New high frequency disturbances from renewables



# Challenges—It may not work! Emerging dynamical problems

## Power system oscillations

- Electro-mechanical—**older problems** (inter-area slow frequency oscillations; torsional oscillations)
- Electromagnetic oscillations and their control—**newer problems** (caused by large generator faults in BPS; wind gusts/solar radiance in BPS/distribution/microgrids; **SSCI—control induced, forced**)

## •Stability assessment

- Extensive simulations-based studies; eigenvalue analysis
- Hard to scale up, and find causes and effects

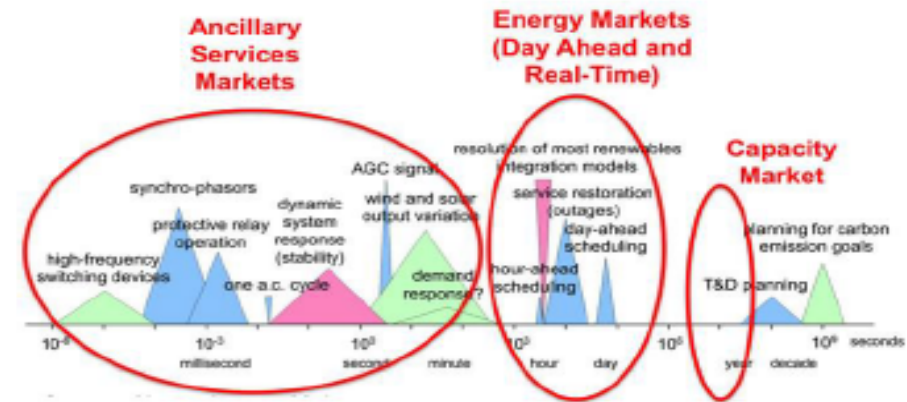
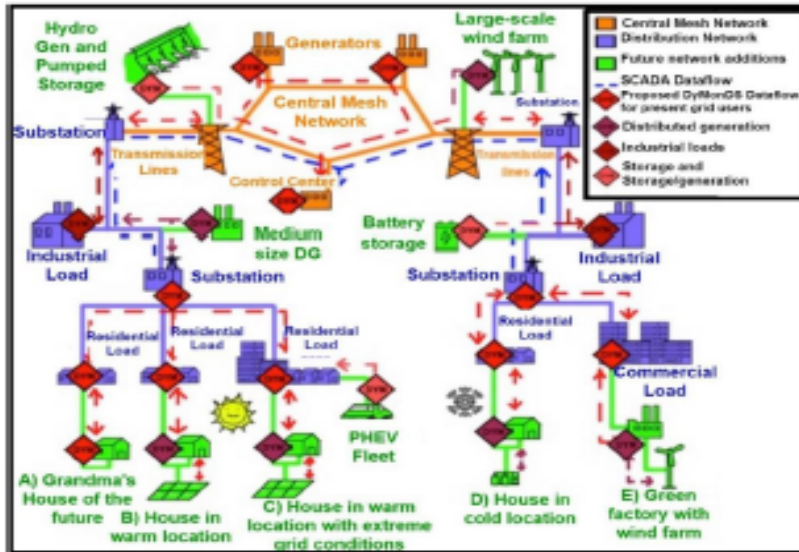
## •Control for ensuring stable operations

- No systematic approaches to designing control for provably stable frequency/voltage regulation within reliability standards
- The worst case approach which does not ensure desired operations; various FFR, RFR system-specific requirements
- Sporadic R&D under different modeling assumptions

- ❖ **Sensing, communications, control technologies mature**
- ❖ **Missing piece of the puzzle: Integration framework for aligning end users, resources and governance system**
- ❖ **Multi-layered interactive data-enabled (Internet-like) protocols**
  - Highly distributed decision makers
  - Minimal coordination of interactions

Ilic, M, A roadmap for technology deployment and its utilization at value for the changing electric energy industry, MIT EESG WP2020-2, April 2020.

# Roadblocks to integration into BPS



Missing spatial and temporal signals in

### Operations:

Power and rate of change of power

### Markets:

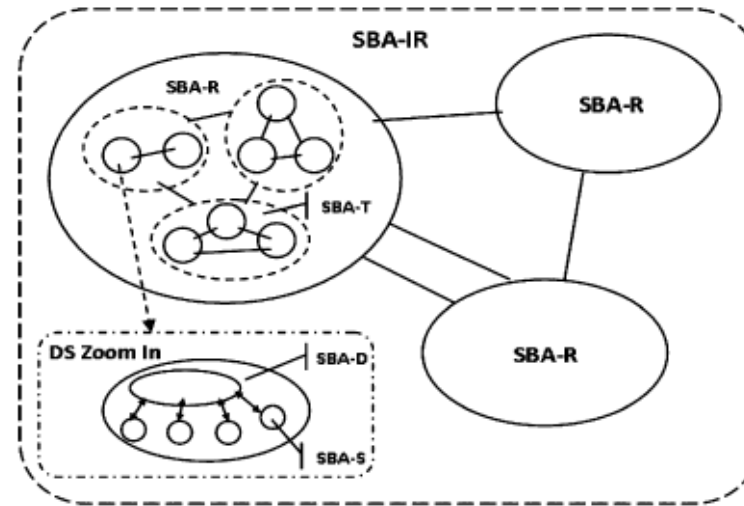
Prices at consumer locations for power and its rate of change and rate of change of power

Need for next generation SCADA (architectures)

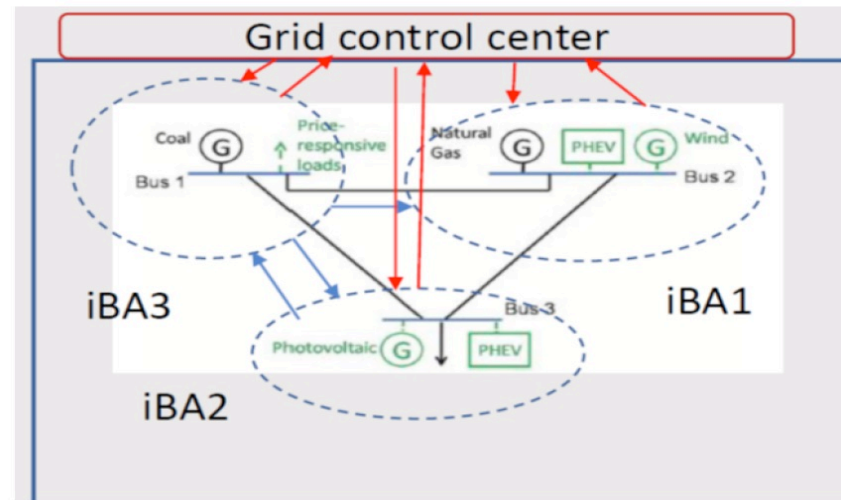
“The systems most fitted for a purpose are those where the number of bits transferred between sub-systems in achieving this purpose is minimized”. (David Hirst, UK consultant, Aug 2016)

# Emerging fundamental needs

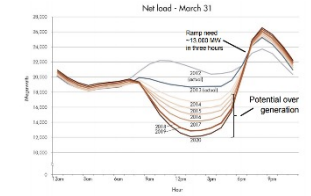
- ❖ New architectures (nested, multi-layered)
- ❖ Operations and planning – data-enabled interactive decisions Multiple heterogeneous decision makers (physics, sub-objectives);
- ❖ Multiple granularity, temporal and spatial; intermittent
- ❖ Need for decision tools at different system layers and for their interactions over time and geography
- ❖ Lack of well-defined protocols for supporting this process
- ❖ Lack of provable software algorithms



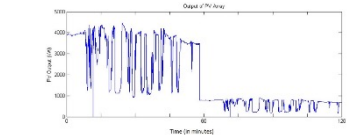
Intelligent Balancing Authorities (iBAs)



## Temporal inter-twining

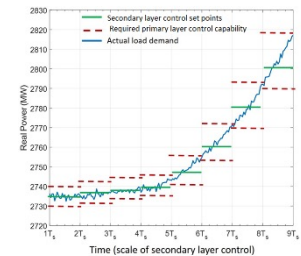
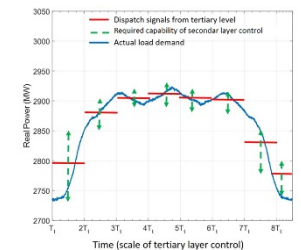


## Aggregate effect of solar



## Local solar

## Hard to predict inputs



## Nonzero mean effects

# CPES challenge—enablers of stable clean services

- ❖ The need for enhanced end-to-end SCADA **for managing interactions across DERs/microgrids-DSOs-TSOs-ISOs** ; future SCADA protocols ?
- ❖ Multi-layered modeling of interactions between the distributed components in terms of common variables (understood by the engineers, economists, regulators)?
- ❖ **The fundamental role of data-enabled software in making components and system performance “better”**
- ❖ **Digital twin that might work?**

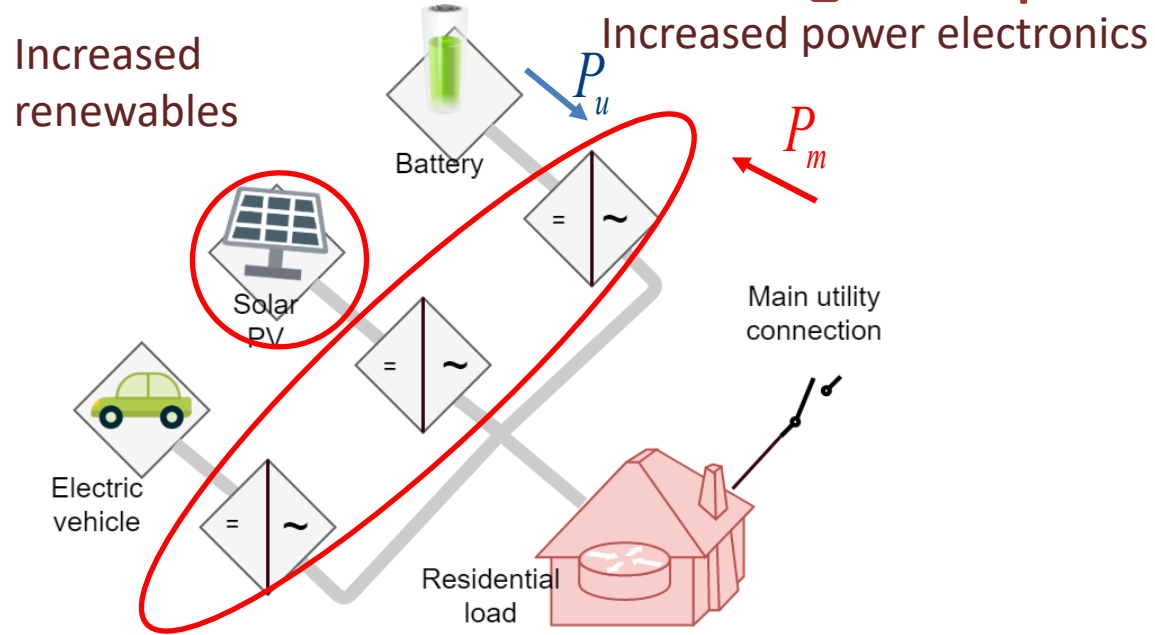


# Typical problems when attempting to integrate smaller-scale MV/LV stakeholders in bulk power systems and electricity markets

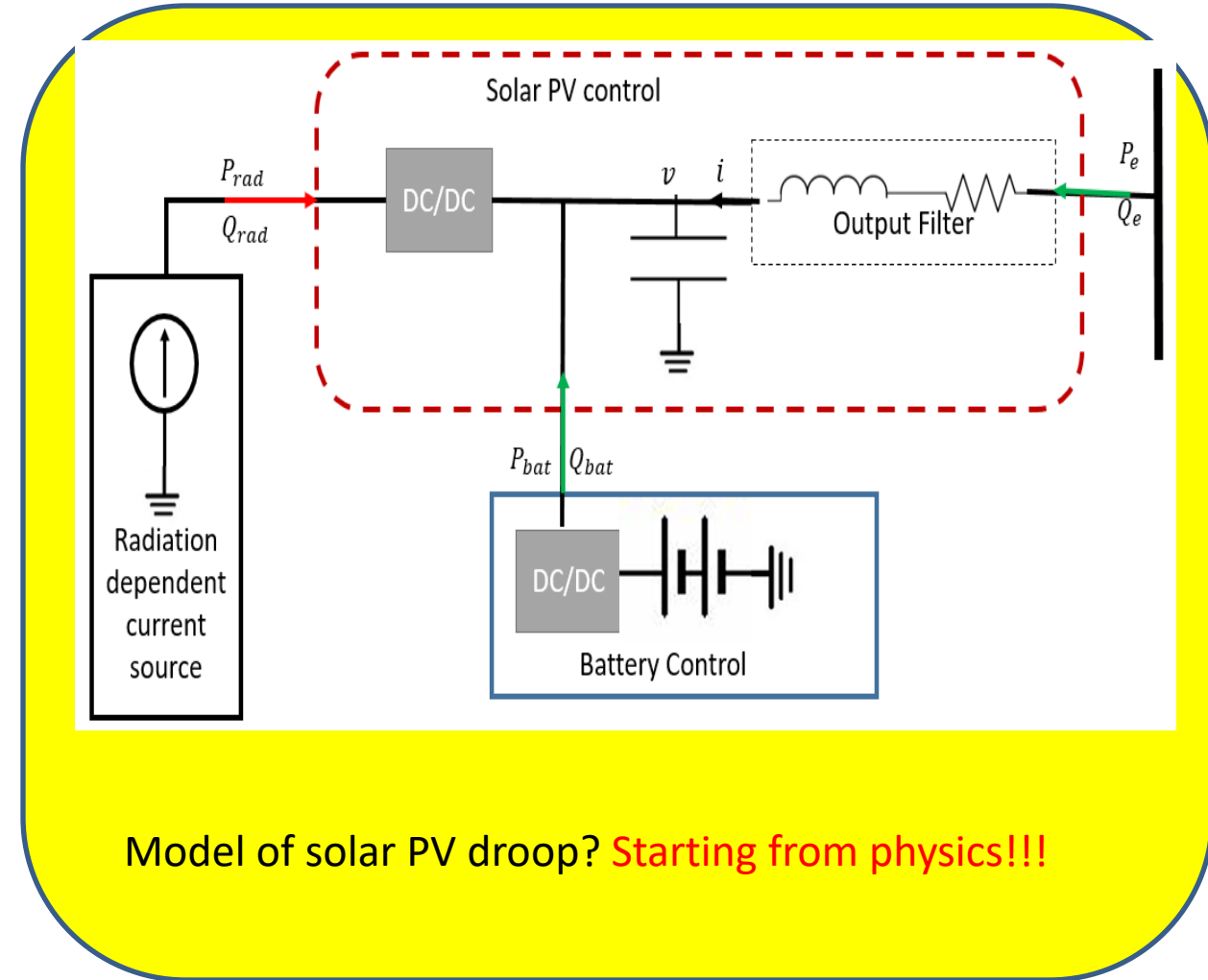
- ❖ Lack of accurate information about the grids and stakeholders' models
- ❖ Numerical problems when combining radial distribution systems software into software which must model their meshed system interactions (typically needed when connecting and disconnecting for economic and reliability reasons)
- ❖ Representing interactive inter-temporal effects; instability concerns
- ❖ **The basic challenge: Establish an interactive co-simulator which enables communications at the interfaces between models and software of different modeling granularity; ultimately a digital twin**

# Basic R&D control challenge:

## Overcoming complexity of modeling and control

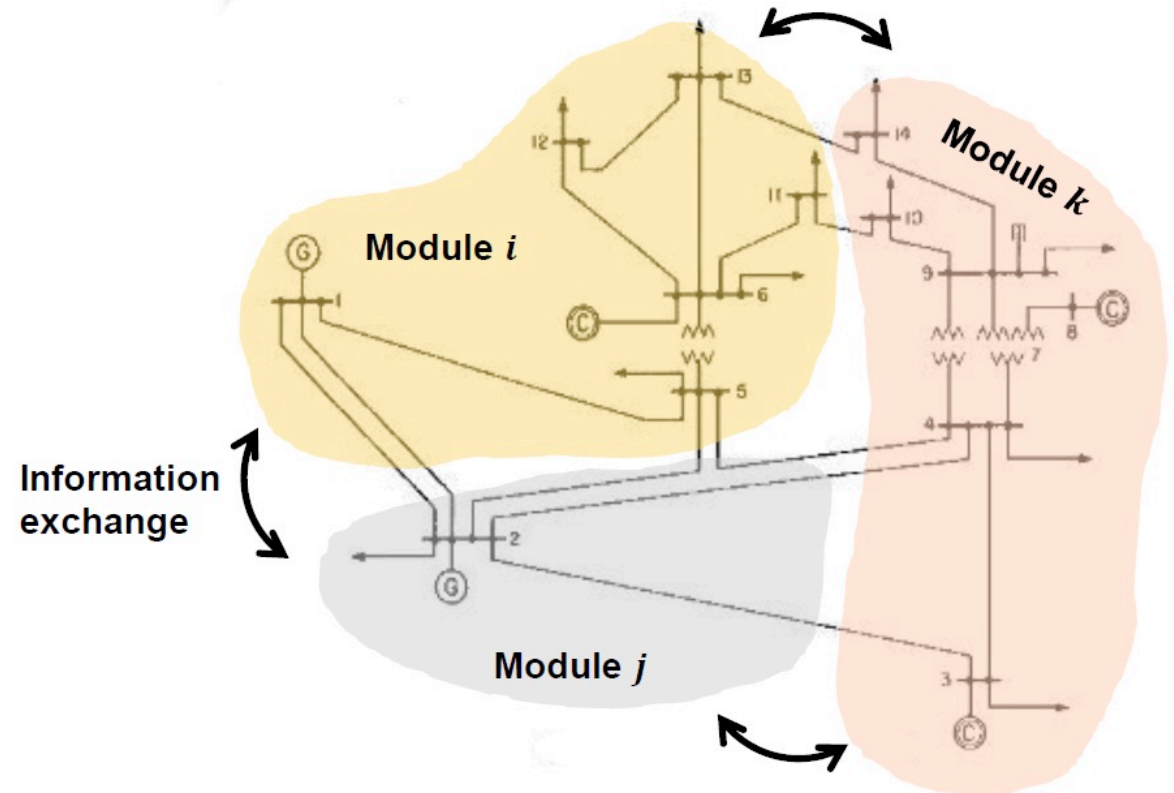
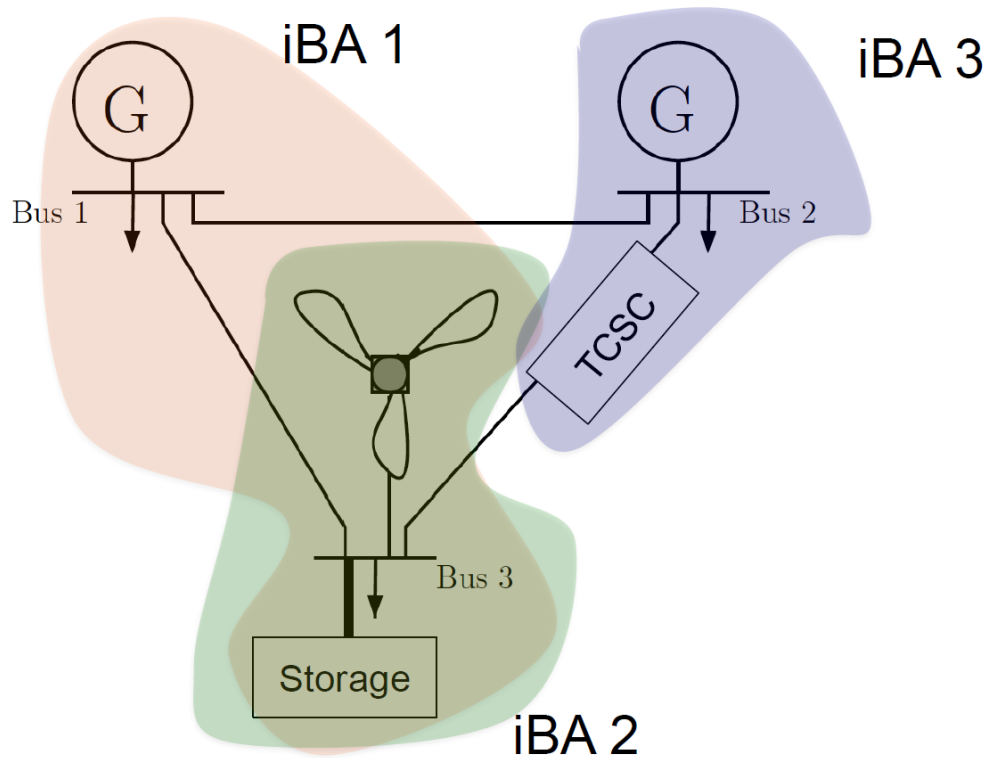


**Crux of the problem:** Present controls are designed for  $P_m(t)$  without considering its dynamical effects



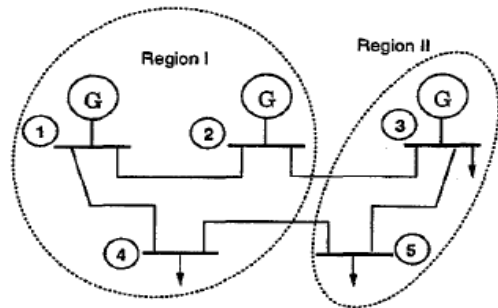
Model of solar PV droop? **Starting from physics!!!**

# Opportunities: Int variables-based information exchange

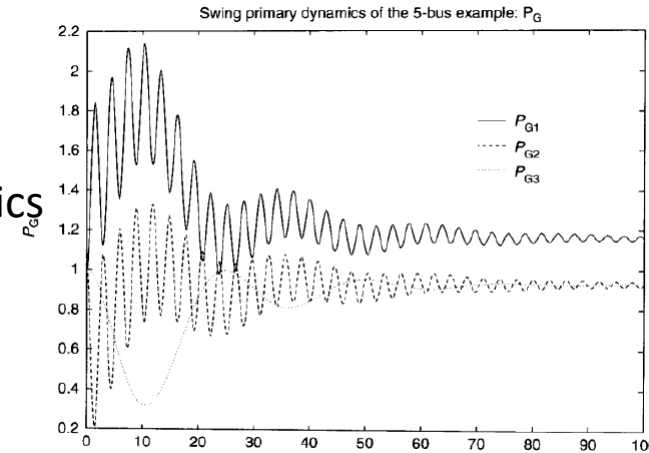


# Inter-area dynamics- interaction variable

The first concept using linearized decoupled real power –frequency dynamical model



Local/internal dynamics



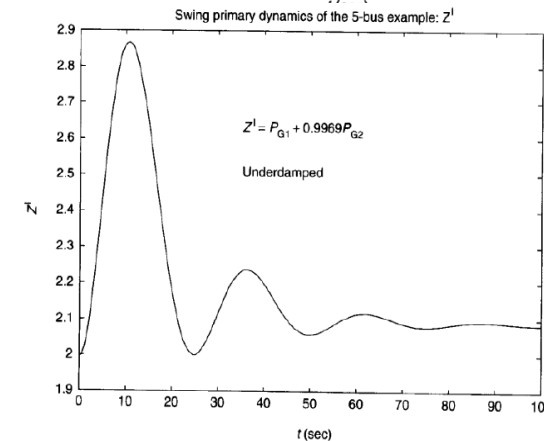
DEFINITION The interarea variables  $z(t)$  are variables that satisfy

$$z(t) = \text{const} \quad (6.121)$$

when all interconnections among the subsystems  $S^i$ ,  $i = I, \dots, R$  are removed, and the system is free of disturbances.

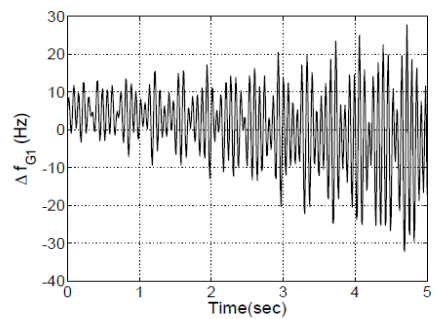
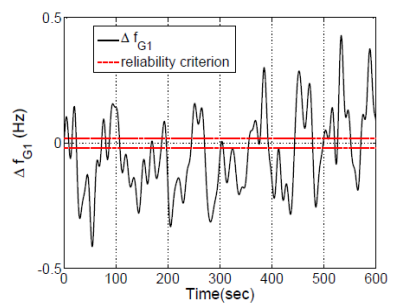
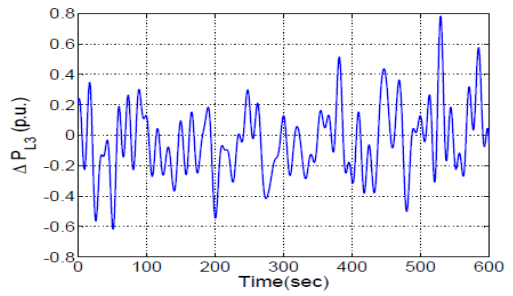
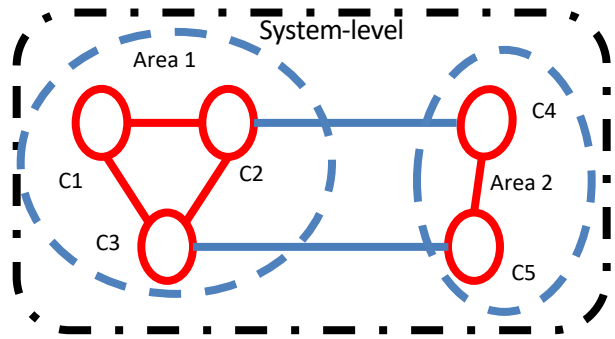
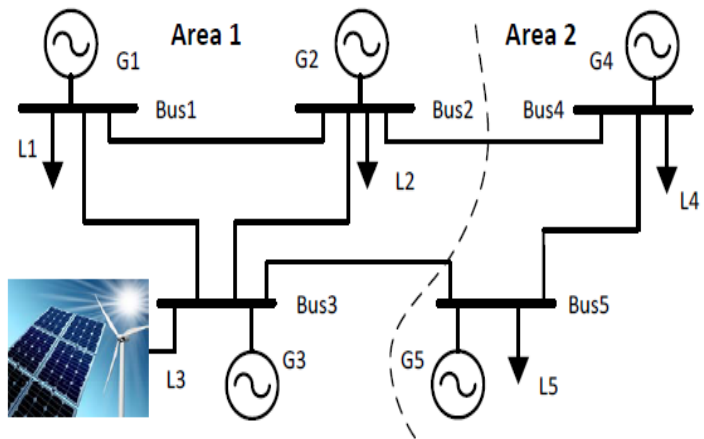
$$z^i(t) = P^i x^i(t), \quad i = I, II, \dots \quad (6.122)$$

$$z^i(t) = p^i P_G^i \quad (6.131)$$



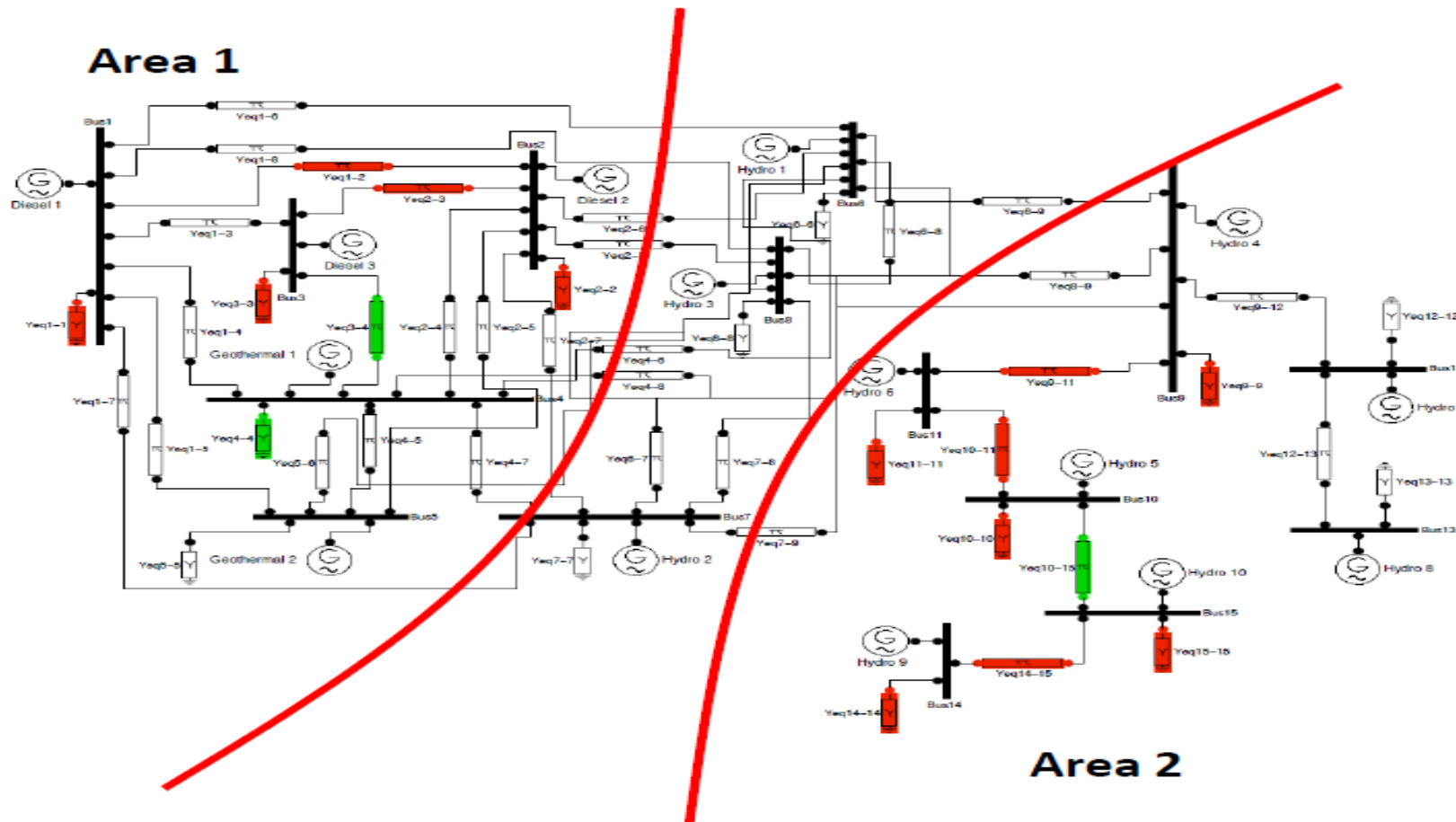
Ilic, Marija, X. Liu, B. Eidson, C. Vialas, and Michael Athans. "A structure-based modeling and control of electric power systems." *Automatica* 33, no. 4 (1997): 515-531.

# Need for coordinated frequency control with intermittent disturbances



**CONTINUOUS POWER FLUCTUATIONS AND OPERATING PROBLEMS (POOR FREQUENCY QUALITY, INSTABILITIES)**

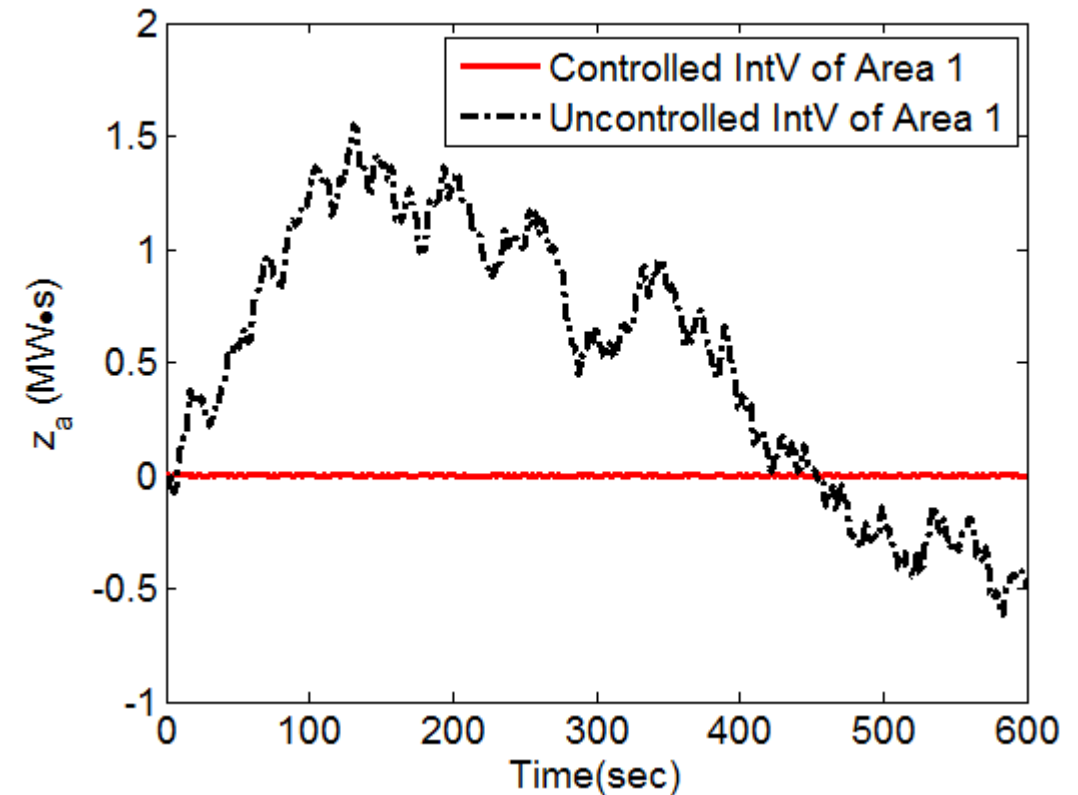
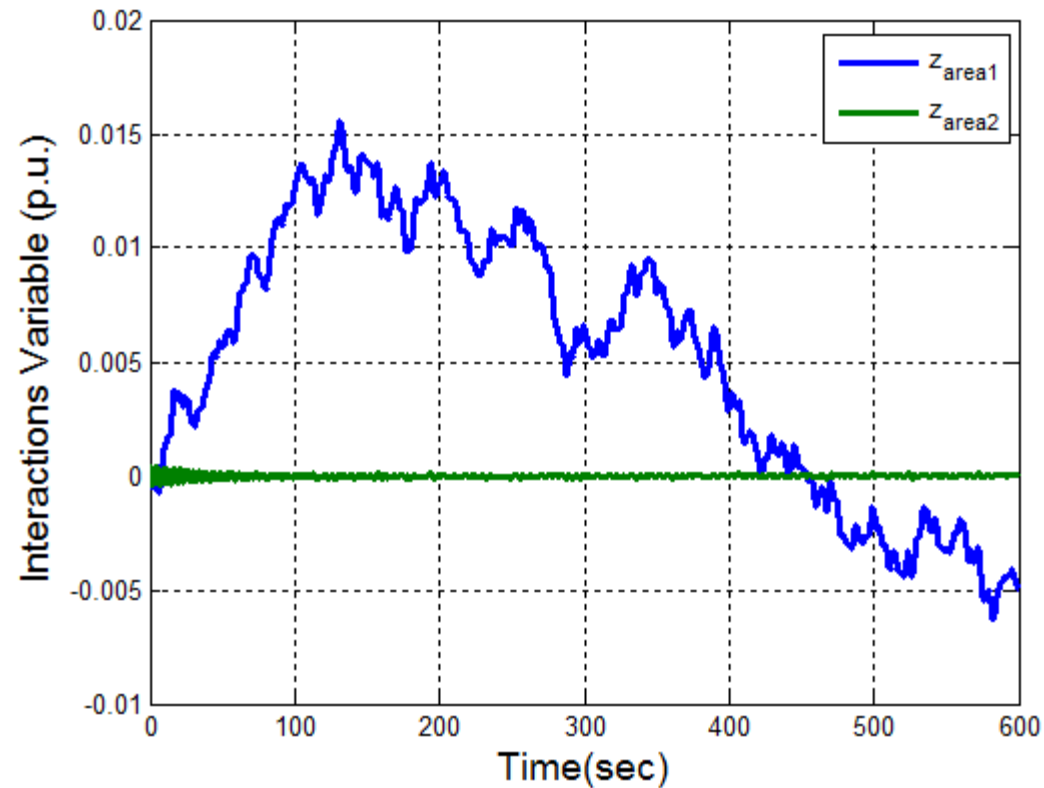
# Dynamics of interaction variables between the areas—Sao Miguel



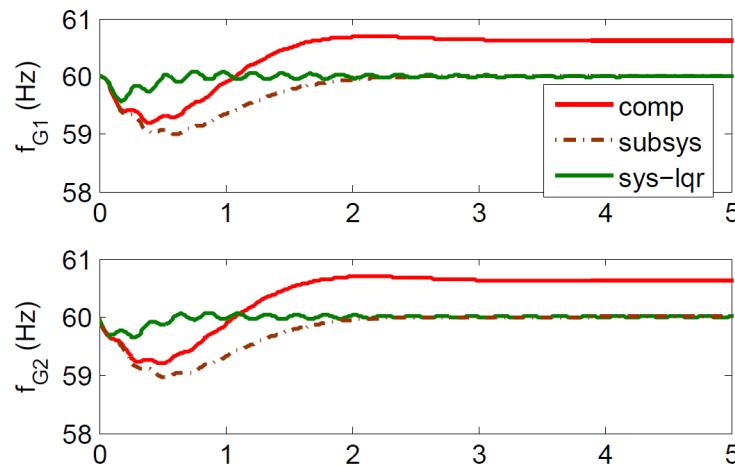
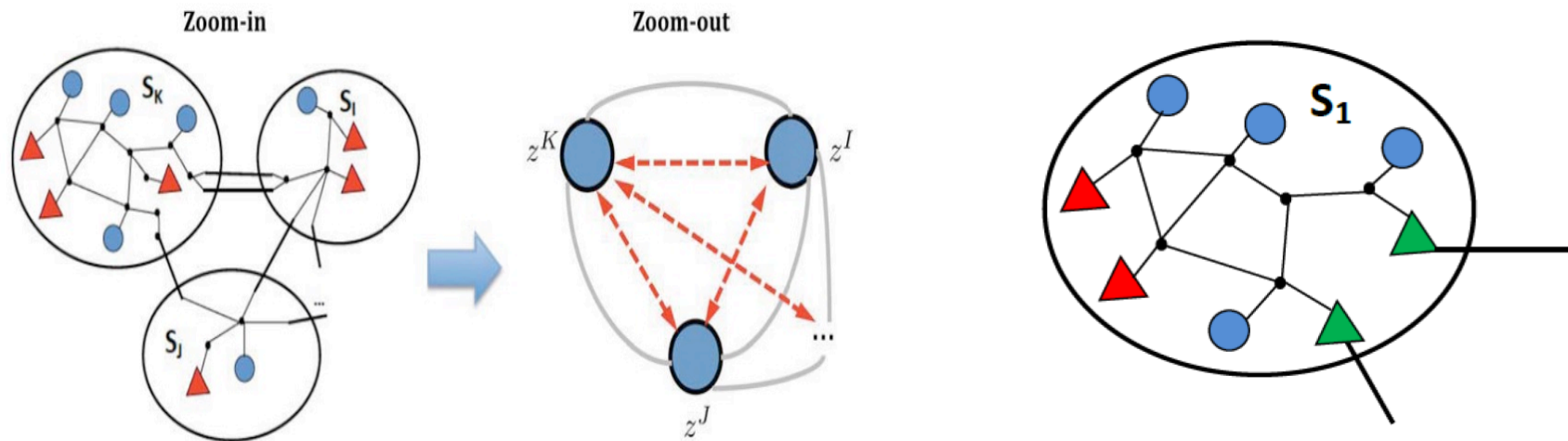
[2] M. Ilic "The Tale of Two Green Islands in the Azores Archipelago," Chapter 2 of Engineering IT-Enabled Sustainable Electricity Services : The Tale of Two Low-Cost Green Azores Islands.

# Key notion of interaction variable dynamics and its control

- ❖ Interactions variables of area-1 and area-2
- ❖ Controlled IntV v.s. uncontrolled IntV



# Frequency stabilization using intVar

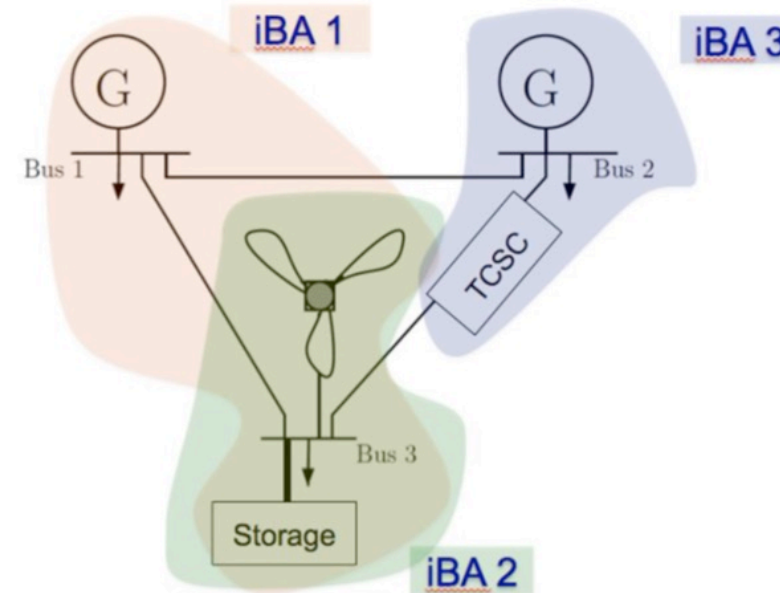
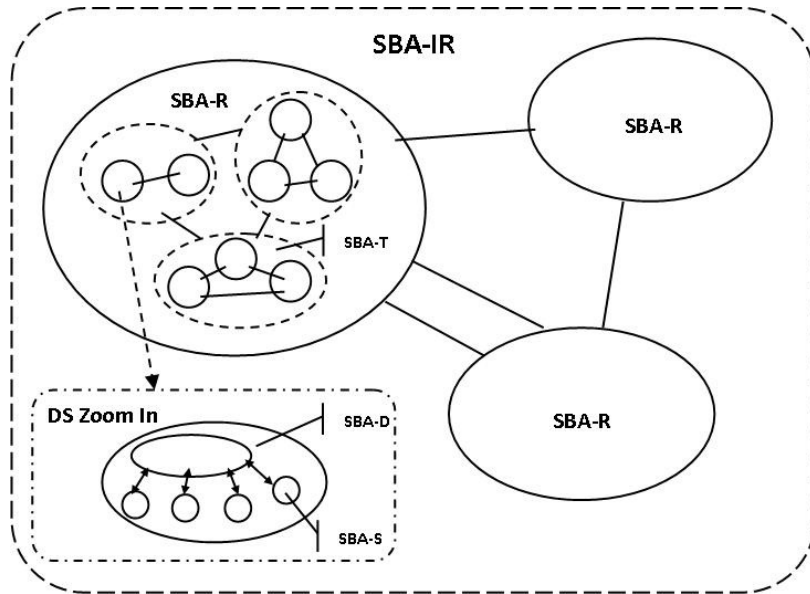


- Dependence of frequency response on power balancing control (generator , BA level, system levels)
- Use of intVars makes these **scalable**



# Is there a more general simple paradigm? General structure of electric energy systems

-general idea---rethink physical dynamics in terms of interaction variables



Note: SBAs renamed to iBAs (suggestion by a PSERC member some time ago)

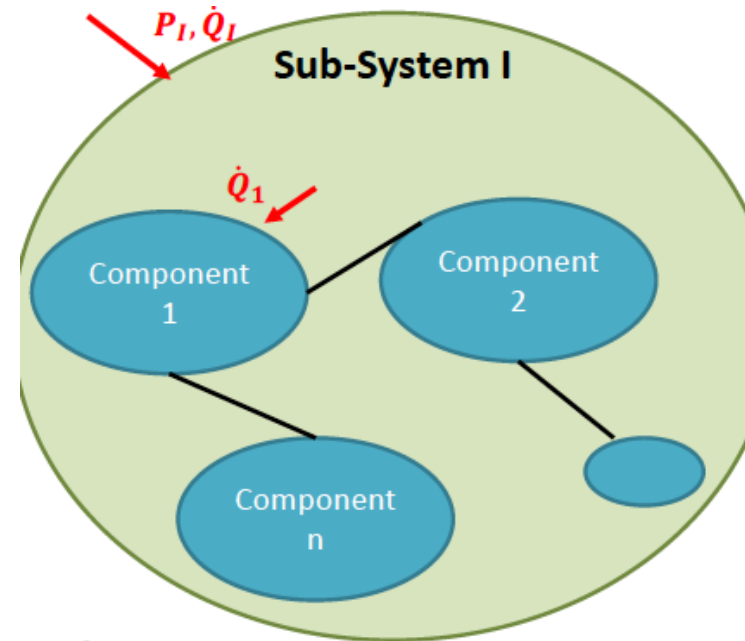
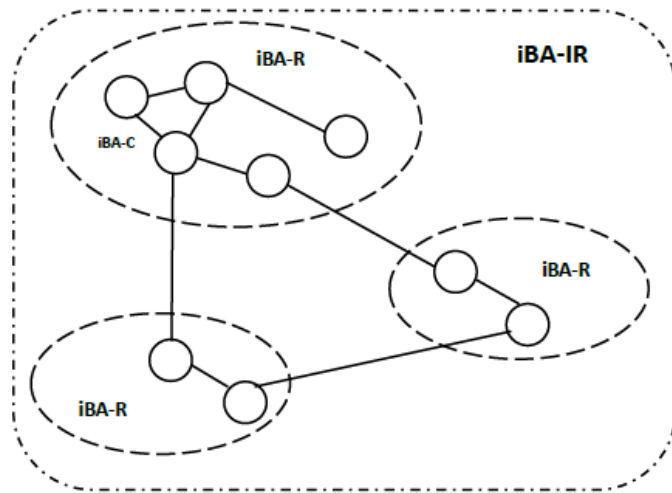
*Ilic, M., "Dynamic Monitoring and Decision Systems for Enabling Sustainable Energy Services", Network Engineering for Meeting the Energy and Environmental Dream, Scanning the Issue, Proc. of the IEEE, 2011.*

*Baros, S., & Ilic, M. (2014, July). intelligent Balancing Authorities (iBAs) for transient stabilization of large power systems. In 2014 IEEE PES General Meeting| Conference & Exposition (pp. 1-5). IEEE.*

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# Toward a general structure-based simple paradigm?

-general idea---rethink physical dynamics in terms of interaction variables

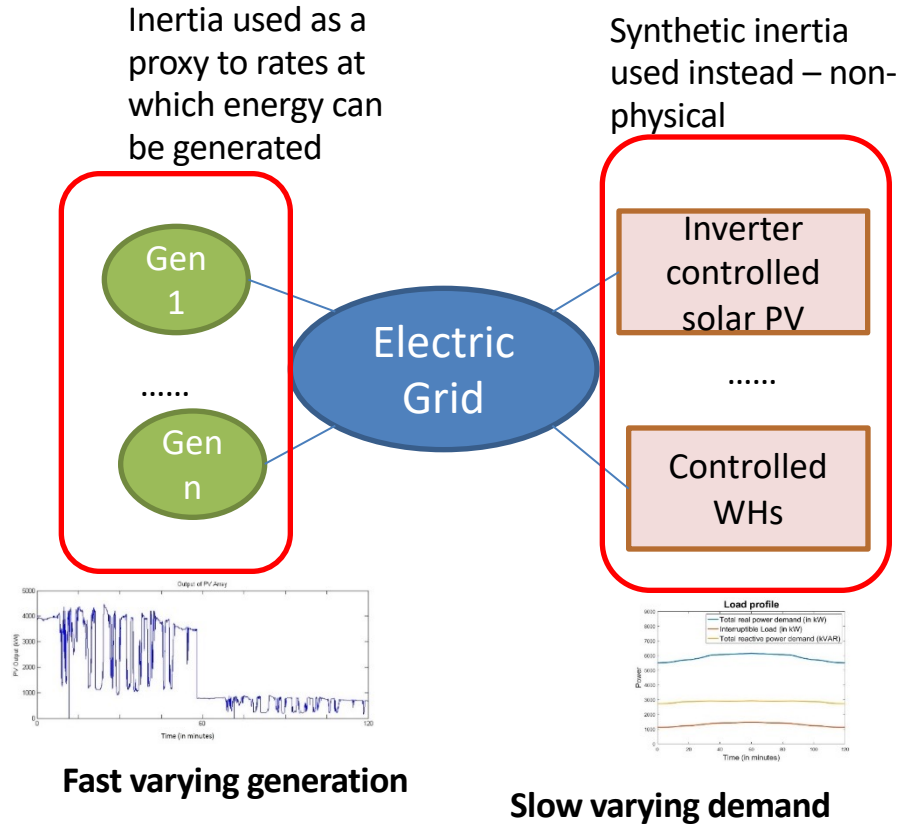


FROM TODAY'S BALANCING AUTHORITIES TO NESTED INTELLIGENT (SMART) BALANCING AUTHORITIES (iBA)

# Unifying energy-based modeling of dynamics

- ❖ Component level (module,  $S$  within the SoS)
- ❖ Interactive model of interconnected systems
- ❖ Model-based system engineering (MBSE)—
  - multi-layered complexity
  - component (modules) – designed by experts for common specifications (energy; power; rate of change of power)
  - interactions subject to conservation of instantaneous power and reactive power dynamics; optimization at system level in terms of these variables
  - physically intuitive models

# Unifying energy-based dynamical modeling



Heterogeneous end-end energy conversion processes modeling is becoming critical - inertia (or synthetic inertia) – based approximated system analysis is not valid

Basis for energy as a state variable

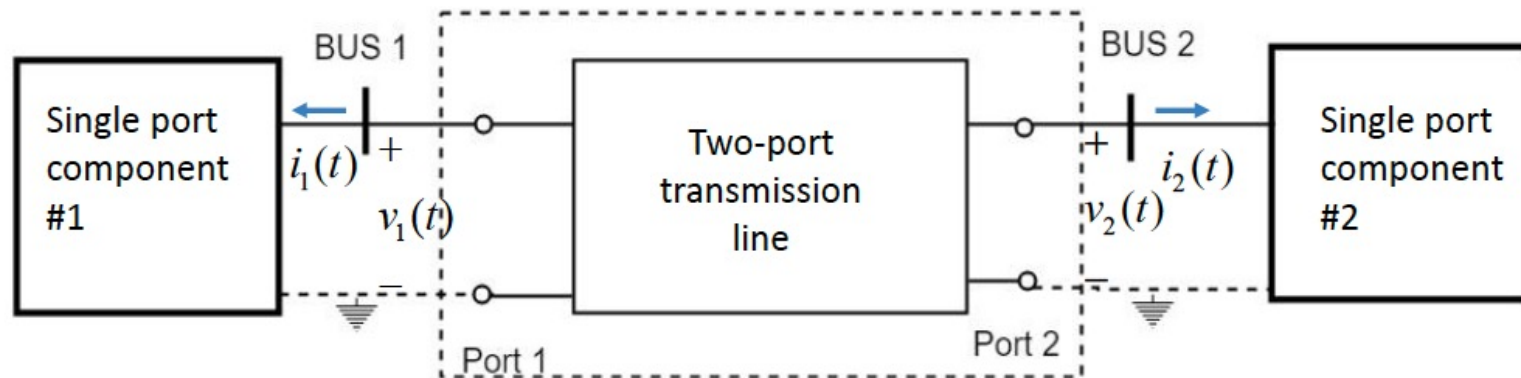
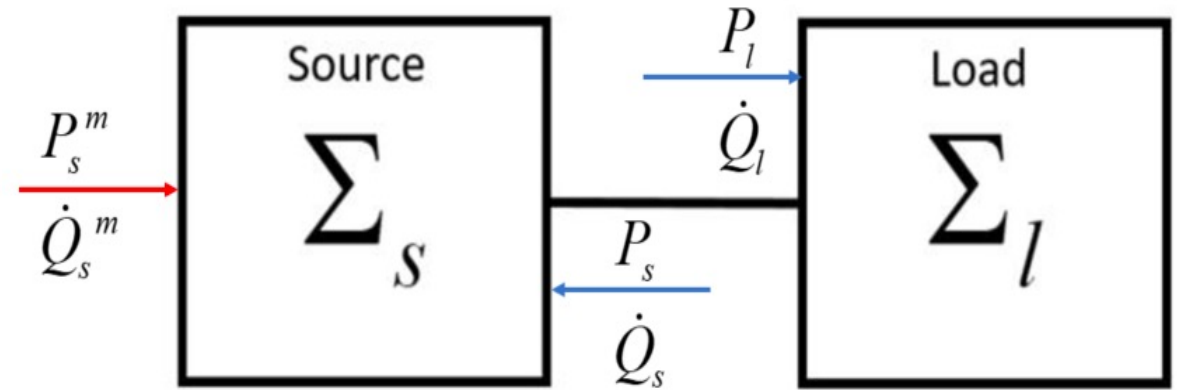
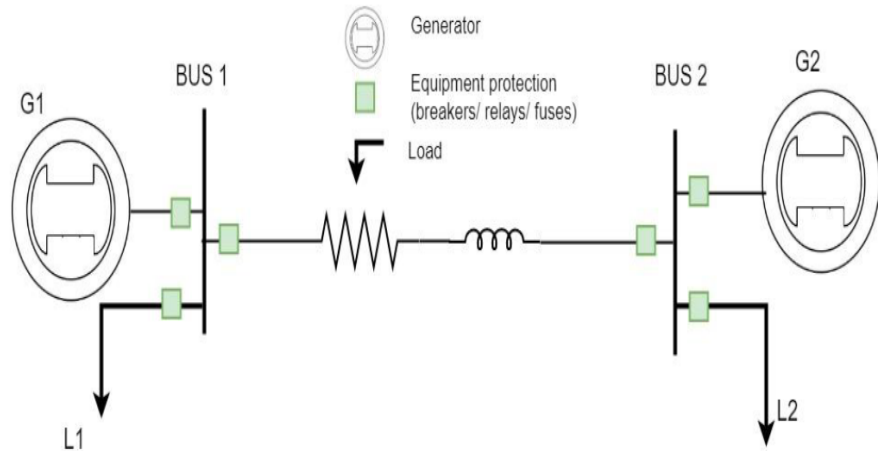
Power conservation laws always hold at the interfaces of components and systems.

Basis for real power as an interface variable

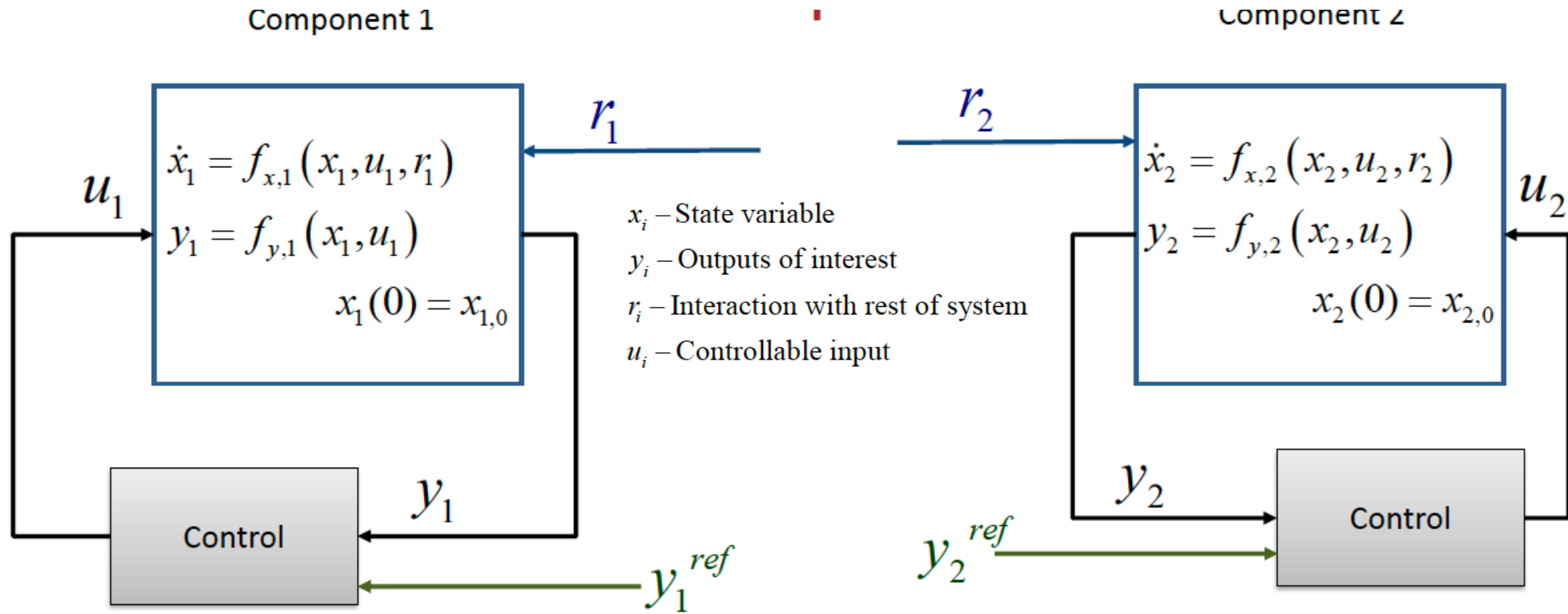
Not all power produced can be delivered fundamentally due to mismatch in rates at which energy conversion processes of connected components take place. Thermal losses ought to be captured

Basis for reactive power as an interface variable

# Modular structure --conventional state space



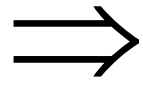
# Standalone component modeling in statespace form



# Overall energy space model:

$$\dot{E} = -\frac{E}{\tau} + P = p$$

$$\dot{p} = 4E_t - \underbrace{(\dot{Q}_L - \dot{Q}_c)}_{\text{Net reactive power absorbed}}$$



$$\dot{E} = -\frac{E}{\tau} + P = p$$

$$\dot{p} = 4E_t - \underbrace{\dot{Q}}_{\text{Reactive power entering the port}} + 2 \underbrace{\dot{Q}_c}_{\text{Local reactive power production}}$$

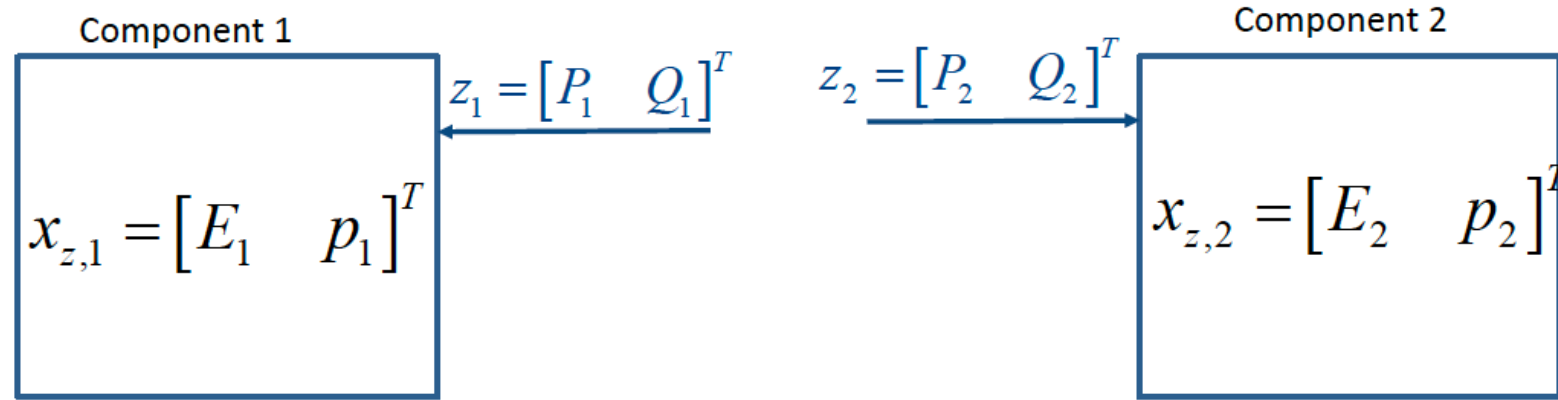
## New definition of rate of change of reactive power—beyond Time Varying Phasor (TVP) Modeling

*Wyatt, J. L., & Ilic, M. (1990, May). Time-domain reactive power concepts for nonlinear, nonsinusoidal or nonperiodic networks. In IEEE international symposium on circuits and systems (pp. 387-390). IEEE.*

This is a result of application of generalized Tellegen's theorem since the reactive power entering the port can be split into inductive and capacitive components (assuming linear restive components)

$$\dot{Q} = \dot{Q}_L + \dot{Q}_C$$

# Energy space modeling of component



Component 1 dynamics

$$\dot{x}_{z,1} = f_{z,1} \left( E_{t,1}(\dot{x}_1), x_{z,1}, \dot{z}_1 \right)$$

where  $x_{z,1}(0) = x_{z,1}^0$

$$E_i = \frac{1}{2} x_i^T H_i x_i$$

$$p_i = x_i^T H_i \dot{x}_i = x_i^T H_i \left( f_{x,i}(x_i, u_i, r_i) \right)$$

$$E_{t,i} = \frac{1}{2} \dot{x}_i^T H_i \dot{x}_i$$

Component 2 dynamics:

$$\dot{x}_{z,2} = f_{z,2} \left( E_{t,2}(\dot{x}_2), x_{z,2}, \dot{z}_2 \right)$$

$$x_{z,2}(0) = x_{z,2}^0$$

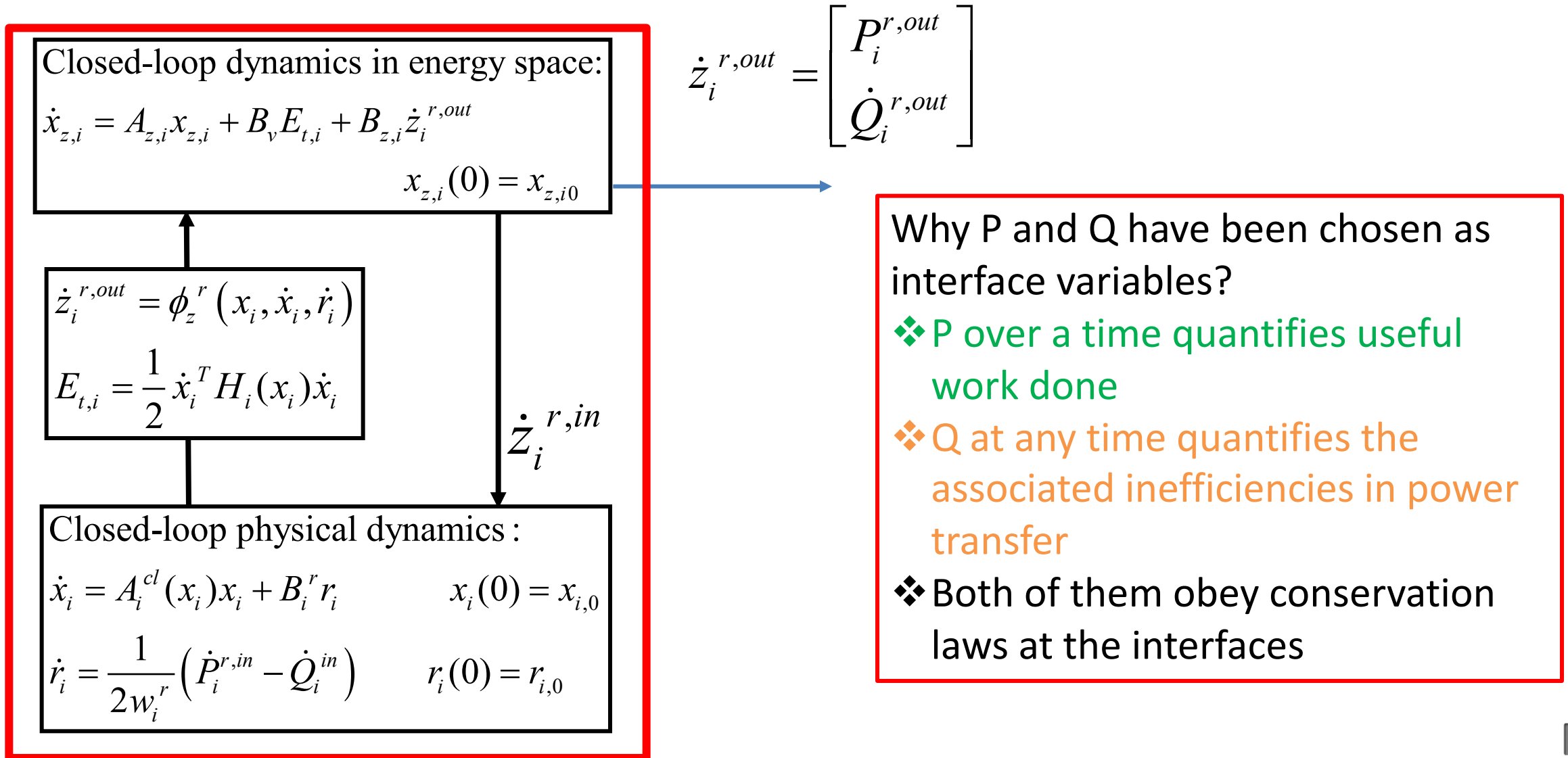
$$P_i = \langle r_i, s_i \rangle$$

$$Q_i = \left\langle r_i, \frac{ds_i}{dt} \right\rangle - \left\langle \frac{dr_i}{dt}, s_i \right\rangle$$

INTERACTIVE!



# Stand-alone interactive model in energy space



# Unifying properties of interaction variables

## Property 1: [Ilic,Liu]

Interaction variables are function of local variable alone

$$z_i^{r,out} = \begin{bmatrix} \int_0^t P_i^{r,out} dt \\ Q_i^{r,out} \end{bmatrix} = \begin{bmatrix} E_i + \int_0^t \frac{E_i}{\tau_i} dt \\ \int_0^t 4E_{t,i} dt - p_i \end{bmatrix} = f(x, \dot{x})$$

**No linearization!**  
**No decoupling!**  
**The same definition**

## Property 2: [Ilic,Liu]

Interaction variable of a component  $i$  is a variable  $z_i^{r,out}$  that satisfies

$$z_i^{r,out}(t) = \text{constant}$$

when all interconnections among subsystems are removed and the system is free of disturbances

$$\dot{z}_i^{r,out} = L_z^{-1} \dot{z}_i^{r,in} = 0$$

## Property 3: (State of art in power systems)

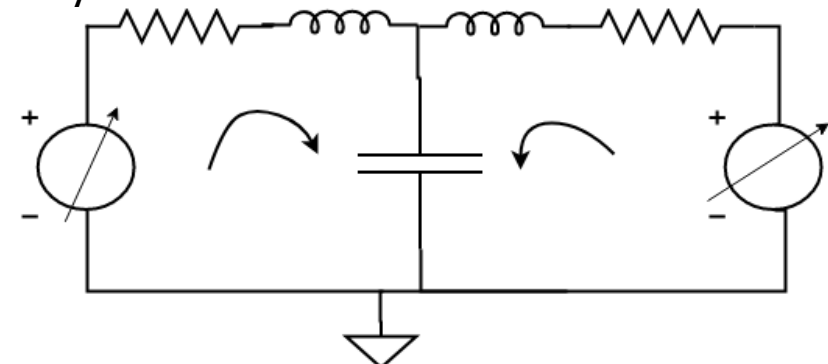
Dynamics of reactive power can be neglected when voltage is not changing

Generalized reactive power:

$$\dot{Q}_i^{r,in} = v_i \frac{di_i}{dt} - \cancel{\frac{dv_i}{dt} i_i} = \dot{P}_i^{r,in}$$

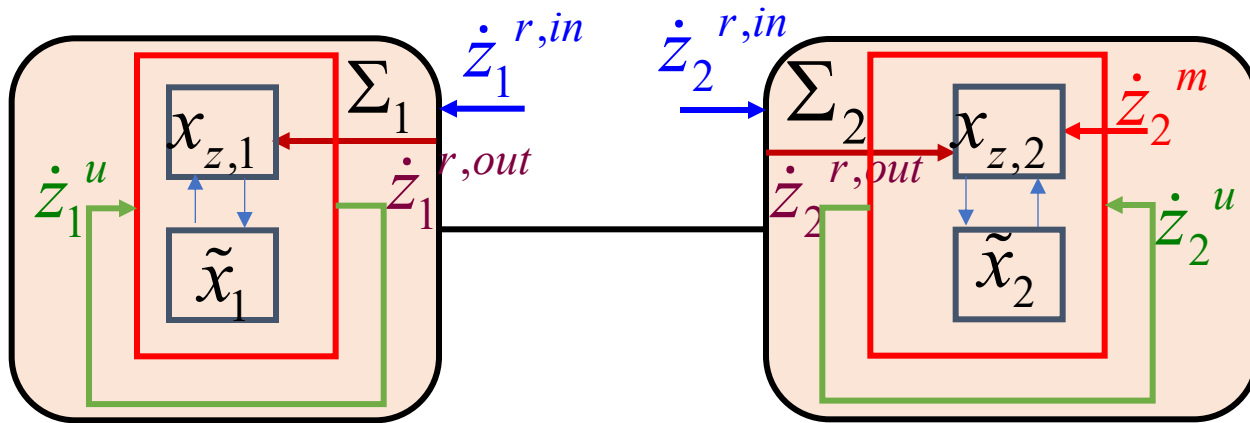
## Property 4: (Circulating currents)

Circulating currents are indicative of non-zero reactive power dynamics

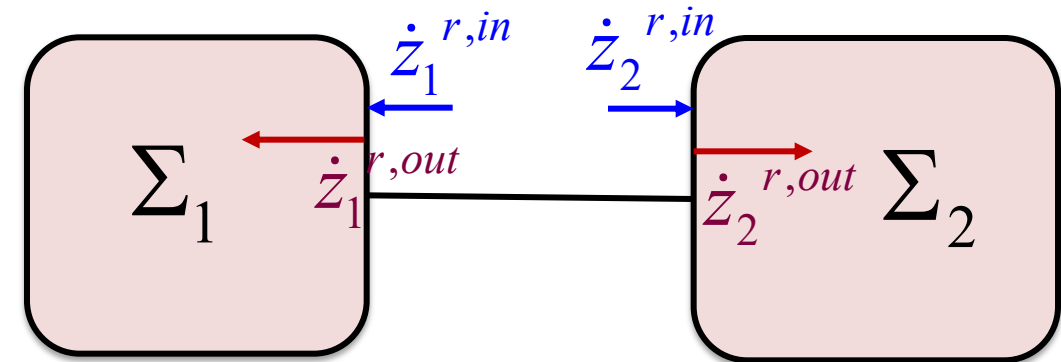


# Representation of interactions within and across components

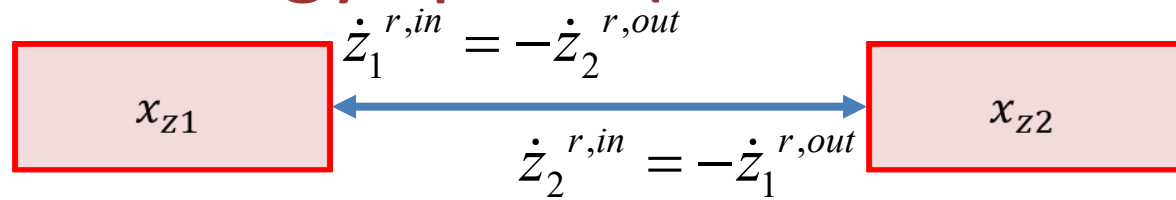
Zoomed-in representation:



Zoomed-out representation:



# Structure of interconnected system model in transformed energy space (linear, interactive)



Distributed modular model

$$\dot{x}_{z,1} = A_{z,1}x_{z,1} + B_t E_{t,1} + B_z \dot{z}_1^{r,out}$$

$$\dot{x}_{z,2} = A_{z,2}x_{z,2} + B_t E_{t,2} + B_z \dot{z}_2^{r,out}$$

$$\begin{bmatrix} \dot{z}_1^{r,out} \\ \dot{z}_2^{r,out} \end{bmatrix} = \underbrace{\begin{bmatrix} 0 & -I_{2 \times 2} \\ -I_{2 \times 2} & 0 \end{bmatrix}}_{L_z}^{-1} \begin{bmatrix} \dot{z}_1^{r,in} \\ \dot{z}_2^{r,in} \end{bmatrix}$$

$$x_{z,i} = \begin{bmatrix} E_i \\ p_i \end{bmatrix} \quad \dot{z}_i^{r,out} = \begin{bmatrix} P_i^{r,out} \\ \dot{Q}_i^{r,out} \end{bmatrix} \quad \forall i \in \{1, 2\}$$

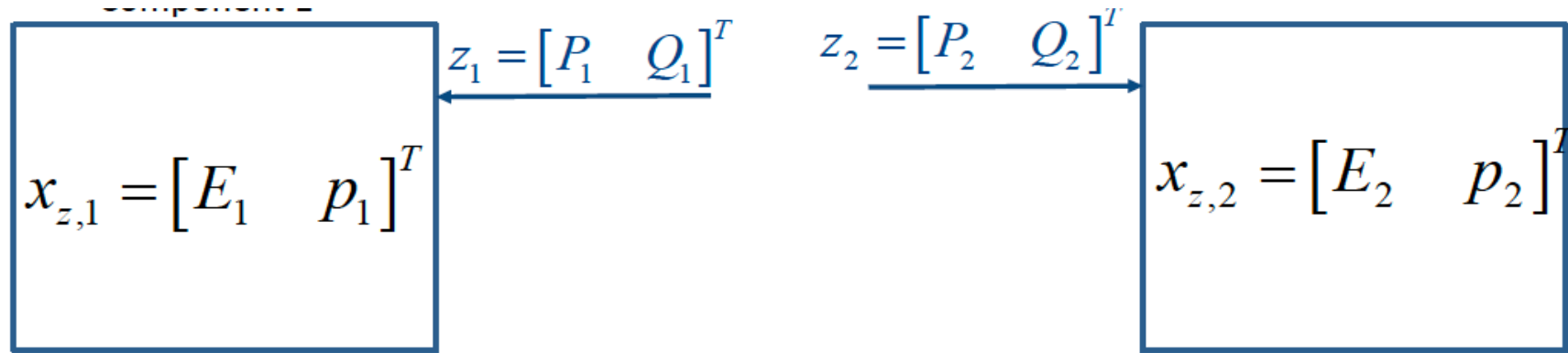
$$A_{z,i} = \begin{bmatrix} -\frac{1}{\tau_i} & 0 \\ 0 & 0 \end{bmatrix} \quad B_t = \begin{bmatrix} 0 \\ 4 \end{bmatrix} \quad B_z = \begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix}$$

ODE model at interconnection level

$$\dot{\mathbf{x}}_z = \underbrace{\begin{bmatrix} A_{z,1} & 0 \\ 0 & A_{z,2} \end{bmatrix}}_{A_z} \mathbf{x}_z + \underbrace{\begin{bmatrix} B_t^T & B_t^T \end{bmatrix}}_{B_t} \mathbf{E}_t + \begin{bmatrix} 0_{2 \times 2} & -I_{2 \times 2} \\ I_{2 \times 2} & 0_{2 \times 2} \end{bmatrix} \mathbf{z}^{r,in}$$

$$\mathbf{x}_z = \begin{bmatrix} x_{z,1} \\ x_{z,2} \end{bmatrix} \quad \mathbf{E}_t = \begin{bmatrix} E_{t,1} \\ E_{t,2} \end{bmatrix} \quad \mathbf{z}^{r,in} = \begin{bmatrix} \dot{z}_1^{r,in} \\ \dot{z}_2^{r,in} \end{bmatrix}$$

# Interactive energy space model of connected system



Component 1 dynamics

$$\dot{x}_{z,1} = f_{z,1} \left( E_{t,1}(\dot{x}_1), x_{z,1}, \dot{z}_1 \right)$$

$$x_{z,1}(0) = x_{z,1}^0$$

Component 2 dynamics:

$$\dot{x}_{z,2} = f_{z,2} \left( E_{t,2}(\dot{x}_2), x_{z,2}, \dot{z}_2 \right)$$

$$x_{z,2}(0) = x_{z,2}^0$$

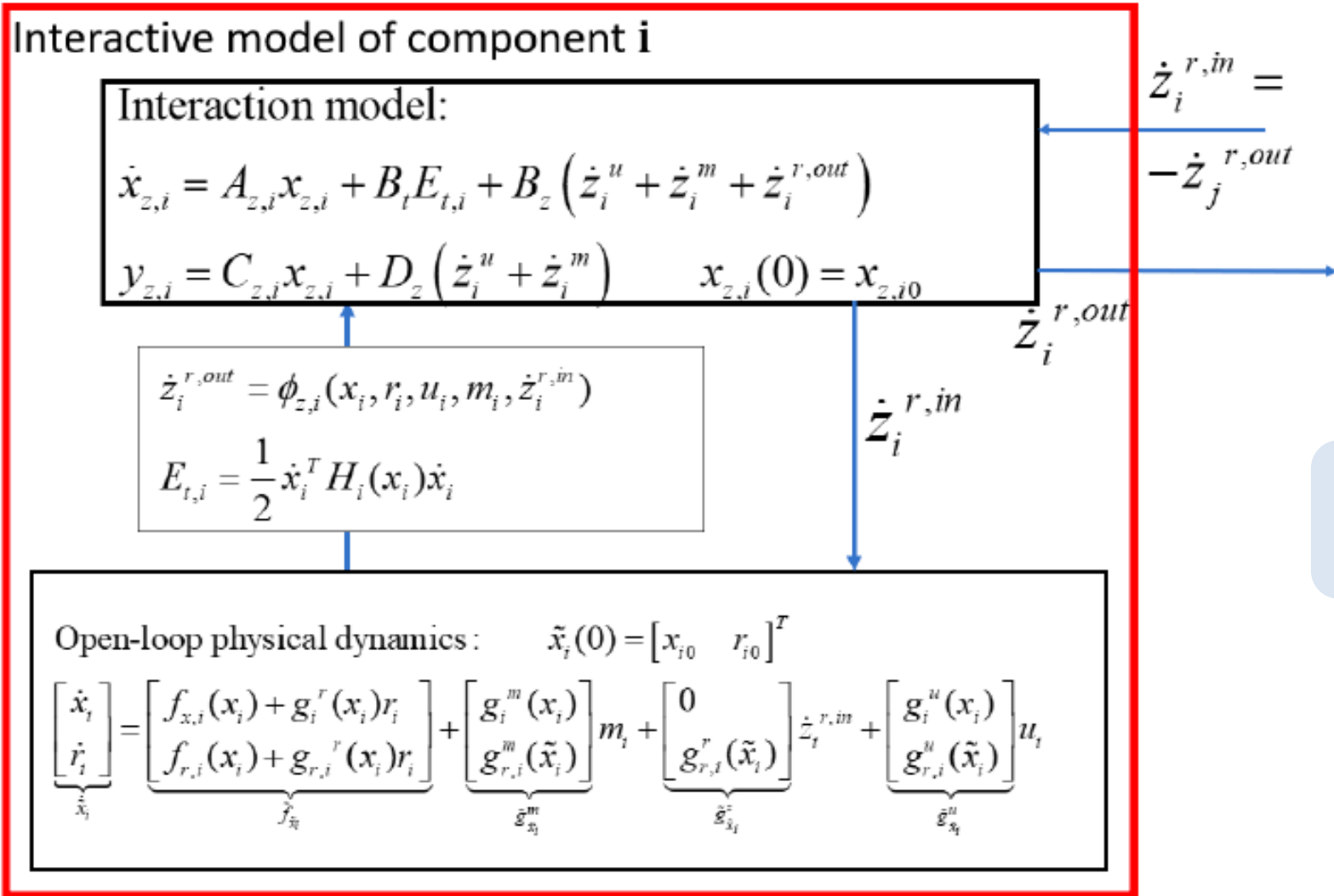
Interconnection:

$$\dot{z}_1 + \dot{z}_2 = 0$$

$Q_1 + Q_2 \neq 0$  because of  
initial stored energy

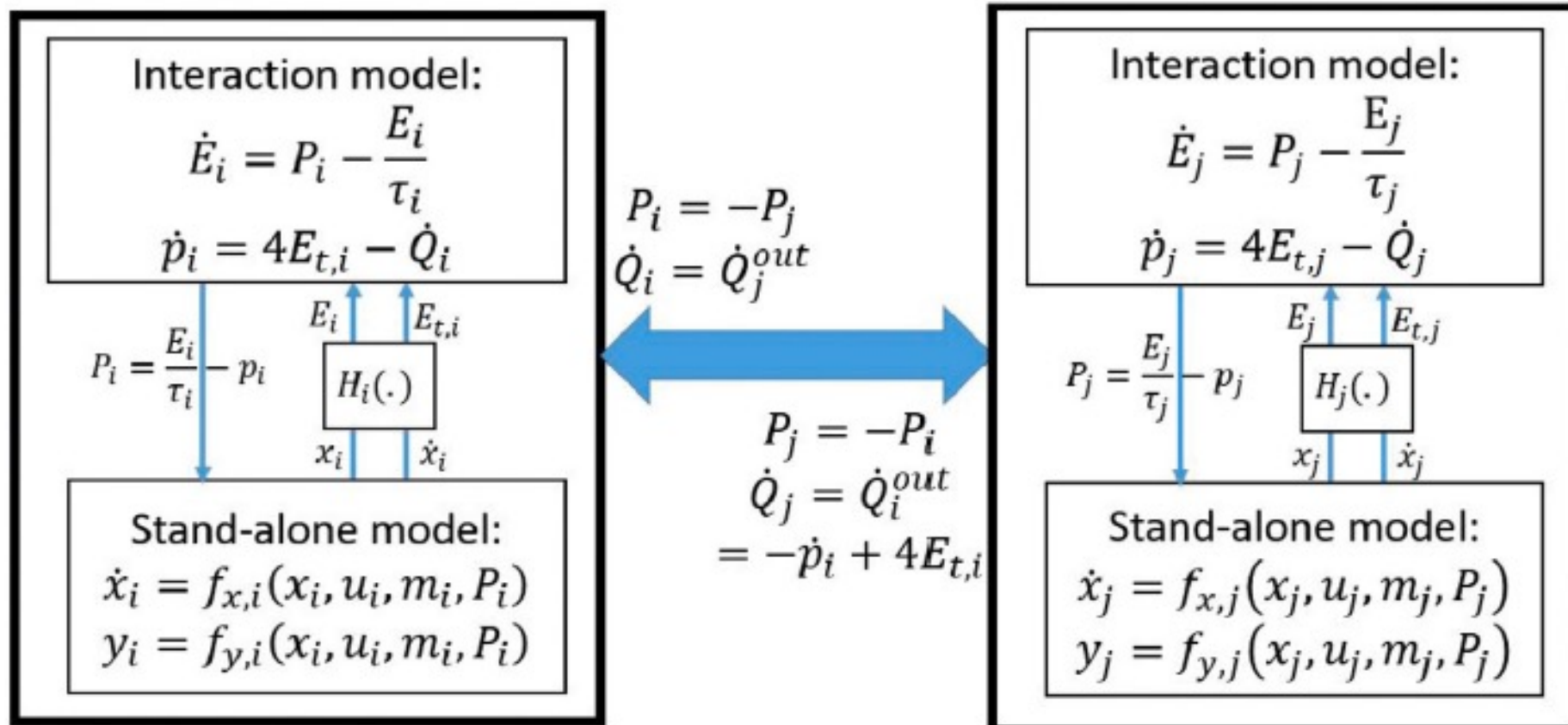
**KEY REASON FOR NEEDING/COMPUTING DERIVATIVES!**

# Modeling of energy dynamics—zoomed in view



**STAND ALONE COMPONENT**

# Unified state space modeling: Zoom out aggregate view



INTER-CONNECTED COMPONENTS

# Dynamic Monitoring and Decision-making System (DYMONDS)

## ❖ Conventional system operation

- Centralized decision making
  - ISO knows and decides all
- Not proper for future electric energy systems
  - Too many heterogeneous decision making components : DGs, DRs, electric vehicles, LSEs, etc.

## ❖ Dynamic Monitoring Decision-making System (DYMONDS)

- Distributed decision making system
  - Distributed optimization of multiple components → computationally feasible
- Individual decisions submitted to ISO (as supply/demand bids)
  - Individual inter-temporal constraints **internalized**
  - Market clearance and overall system balanced by ISO

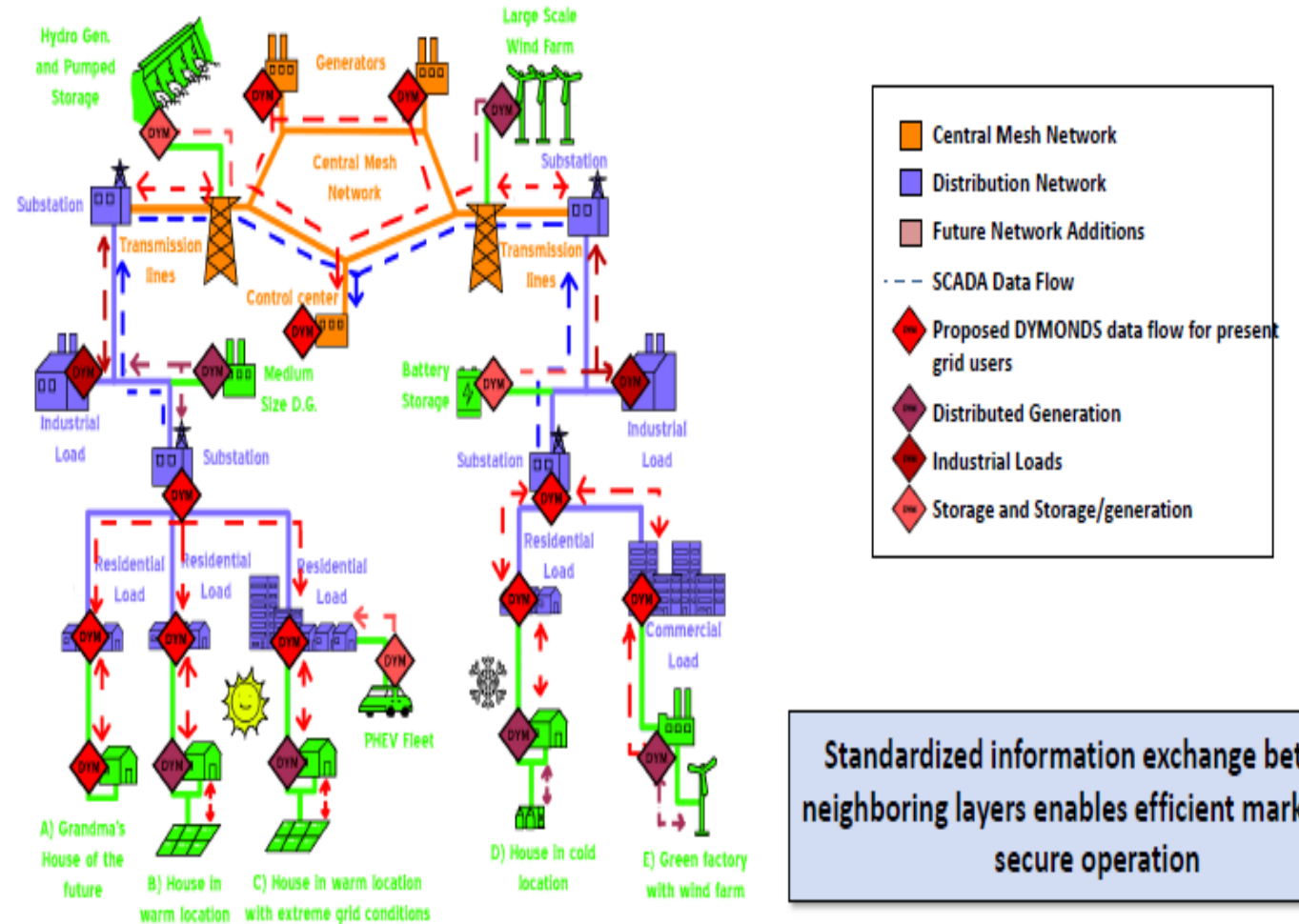


# Protocol principles for evolving Dynamic Monitoring and Decision Systems (DyMonDS) architecture

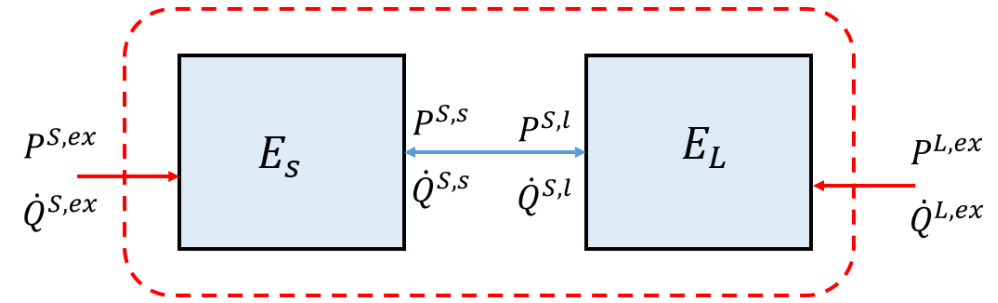
❖ **Information exchange in terms of energy, power and rate of change of reactive power.** intVars with physical interpretation as a generalized ACE.

❖ **BAs transform to iBAs** In order to support interactive control and co-design today's BAs are further organized as iBAs – groups of stakeholders, both utility and third parties, with their own sub-objectives. Each iBA is responsible for electricity services to its members and must communicate its commitments in terms of intVars to participate in electricity services with others

■ **Next generation SCADA to support information exchange among iBAs** As the operating conditions vary, stakeholders process the shared information, and optimize their own sub-objectives, subject to own constraints and preferences; and communicate back their willingness to participate in system-wide integration



# Optimization problem formulation in energy space



$$\min_{P^{S,s}(t), P^{S,l}(t), \dot{Q}^{S,s}(t), \dot{Q}^{S,l}(t), E_t^{S,s}(t), E_t^{S,l}(t)} \int_0^t \dot{Q}^{S,s}(\tau)^2 + \dot{Q}^{S,l}(\tau)^2 d\tau$$

**Constraint Set 2:**  
Source Interaction dynamics:

$$\begin{aligned} \dot{E}_s(t) &= p_s(t) = \\ &= P^{S,s}(t) + P^{S,ex}(t) - \frac{E_s(t)}{\tau_s} \\ \dot{p}_s(t) &= 4E_{t,s}(t) - \dot{Q}^{S,g}(t) - \dot{Q}^{S,ex}(t) \end{aligned}$$

$$\begin{aligned} P^{S,s}(t) &= P_s(t); Q^{S,s}(t) = Q_s(t) \\ E_{t,s} &= E_s(\dot{x}_s) \end{aligned}$$

**Constraint Set 3:**  
Load Interaction dynamics:

$$\begin{aligned} \dot{E}_l(t) &= p_l(t) = \\ &= P^{S,l}(t) + P^{L,ex}(t) - \frac{E_l(t)}{\tau_l} \\ \dot{p}_l(t) &= 4E_t^l(t) - \dot{Q}^{S,l}(t) - \dot{Q}^{L,ex}(t) \end{aligned}$$

$$\begin{aligned} P^{S,l}(t) &= P_l(t); Q^{S,l}(t) = Q_l(t) \\ E_{t,l} &= E_l(\dot{x}_l) \end{aligned}$$

**Constraint set 5:**  
Load Stand-alone Component dynamics:

$$\begin{aligned} \dot{x}_l &= f_{x,l}(x_l, u_l, P_l) \\ y_l &= f_{y,l}(x_l, u_l, P_l, \dot{Q}_l) \\ u_l^{\min} &\leq u_l \leq u_l^{\max} \\ y_l^{\min} &\leq y_l \leq y_l^{\max} \end{aligned}$$

**Constraint set 1:**  
Interconnection constraints:

$$\begin{aligned} P^{S,g} + P^{L,g} &= 0 \\ \dot{Q}^{S,g} + \dot{Q}^{L,g} &= 0 \end{aligned}$$

Dissipativity constraint

$$\dot{p}^{S,ex} + \dot{p}^{L,ex} \leq \frac{\dot{E}_s}{\tau_s} + \frac{\dot{E}_l}{\tau_l}$$

Real and Reactive Power Limits

$$\begin{aligned} p_{g,\min} &\leq P^{S,g} \leq p_{g,\max} \\ p_{l,\min} &\leq P^{S,l} \leq p_{l,\max} \\ \dot{q}_{g,\min} &\leq \dot{Q}^{S,g} \leq \dot{q}_{g,\max} \\ \dot{q}_{l,\min} &\leq \dot{Q}^{S,l} \leq \dot{q}_{l,\max} \end{aligned}$$

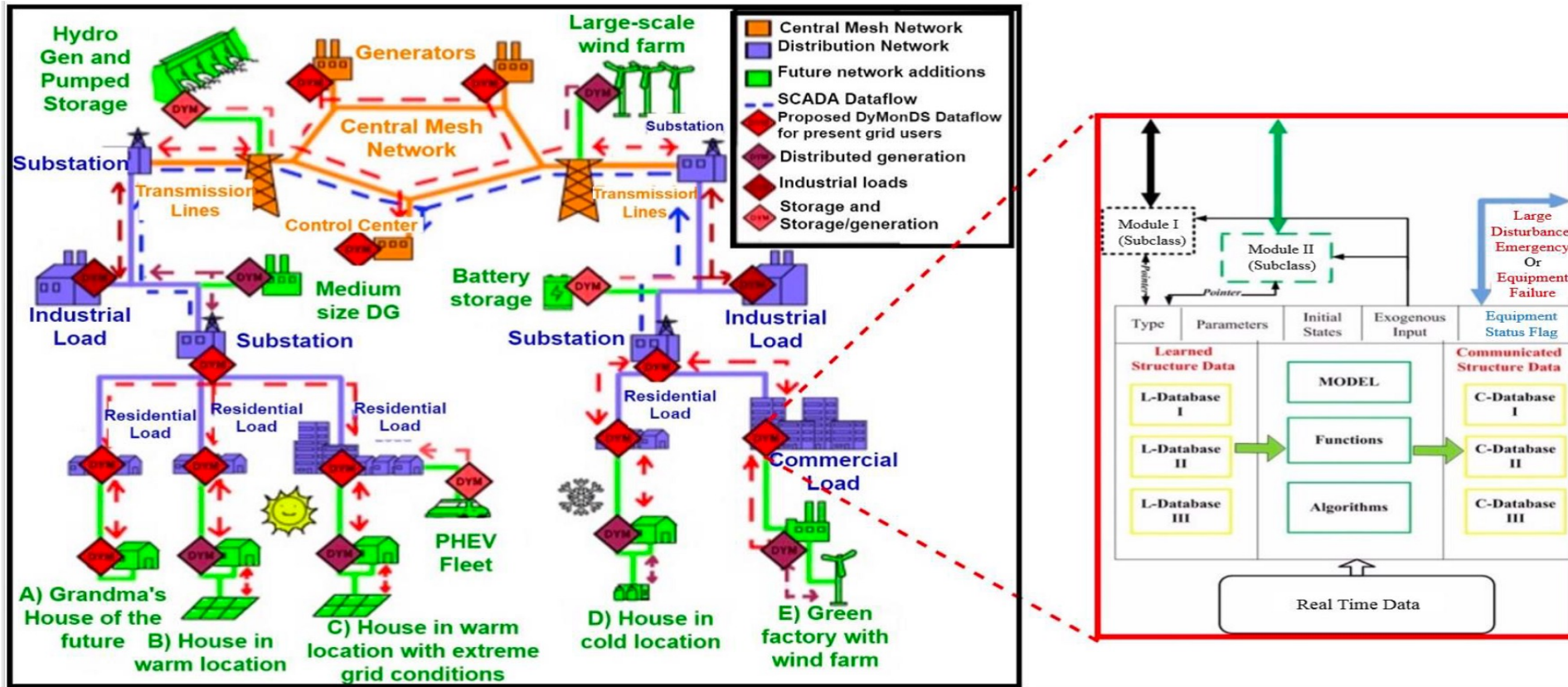
**Constraint set 4:**  
Source Stand-alone Component dynamics:

$$\begin{aligned} \dot{x}_s(t) &= f_{x,s}(x_s(t), u_s(t), P_s(t)) \\ y_s(t) &= f_{y,s}(x_s(t), u_s(t), P_s(t), \dot{Q}_s(t)) \\ u_s^{\min} &\leq u_s(t) \leq u_s^{\max} \\ y_s^{\min} &\leq y_s(t) \leq y_s^{\max} \end{aligned}$$

# MAJOR NEED FOR NEXT GENERATION SOFTWARE

- ❖ COMPLEXITY EMBEDDED IN THE LOWER LAYERS FOR ENABLING “BETTER” SPECIFICATIONS ( $E_T, P, dQ/dT$ ) – automation, smarts, ML, predictions; storage/EV integration
- ❖ AGGREGATION OVER TIME AND STAKEHOLDERS MANAGING INTERACTIONS THROUGH MINIMAL COORDINATION
- ❖ AMPLE EVIDENCE OF ENHANCED RELIABILITY, EFFICIENCY AND RESILIENCY

# Digital twin that might work\*



*The challenge of multi-layered interactive computing: Accurate and efficient derivatives*

\*Ilic, M., Jaddivada, R., & Gebremedhin, A. (2023). Unified modeling for emulating electric energy systems: Toward digital twin that might work. In *Research Anthology on BIM and Digital Twins in Smart Cities* (pp. 107-135). IGI Global.

# Conclusions—

- ❖ Multi-level transformed state space formulation of decision making in the changing electric energy industry lends itself to non-convex dual optimization problems
- ❖ Natural alignment of economic incentives, efficient scheduling and end user choice
- ❖ Can be used for establishing standards protocols and giving the right incentives
- ❖ Next step— distributed management of uncertainty
- ❖ Lower layer specifications must be defined in terms of common technology-agnostic variables