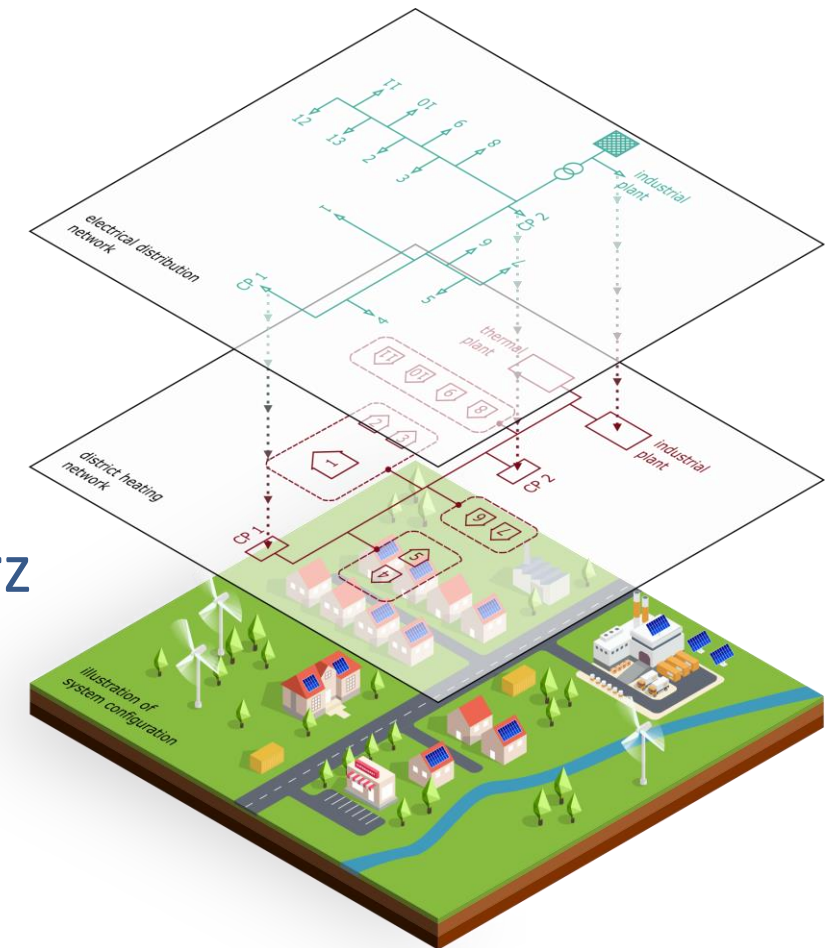


# Modelling and simulation of integrated energy systems

Edmund Widl, Peter Palensky, Jan Sören Schwarz

ERIGrid 2.0 / SINERGY / RESili8 Online Training Lecture Part 1



# Outline



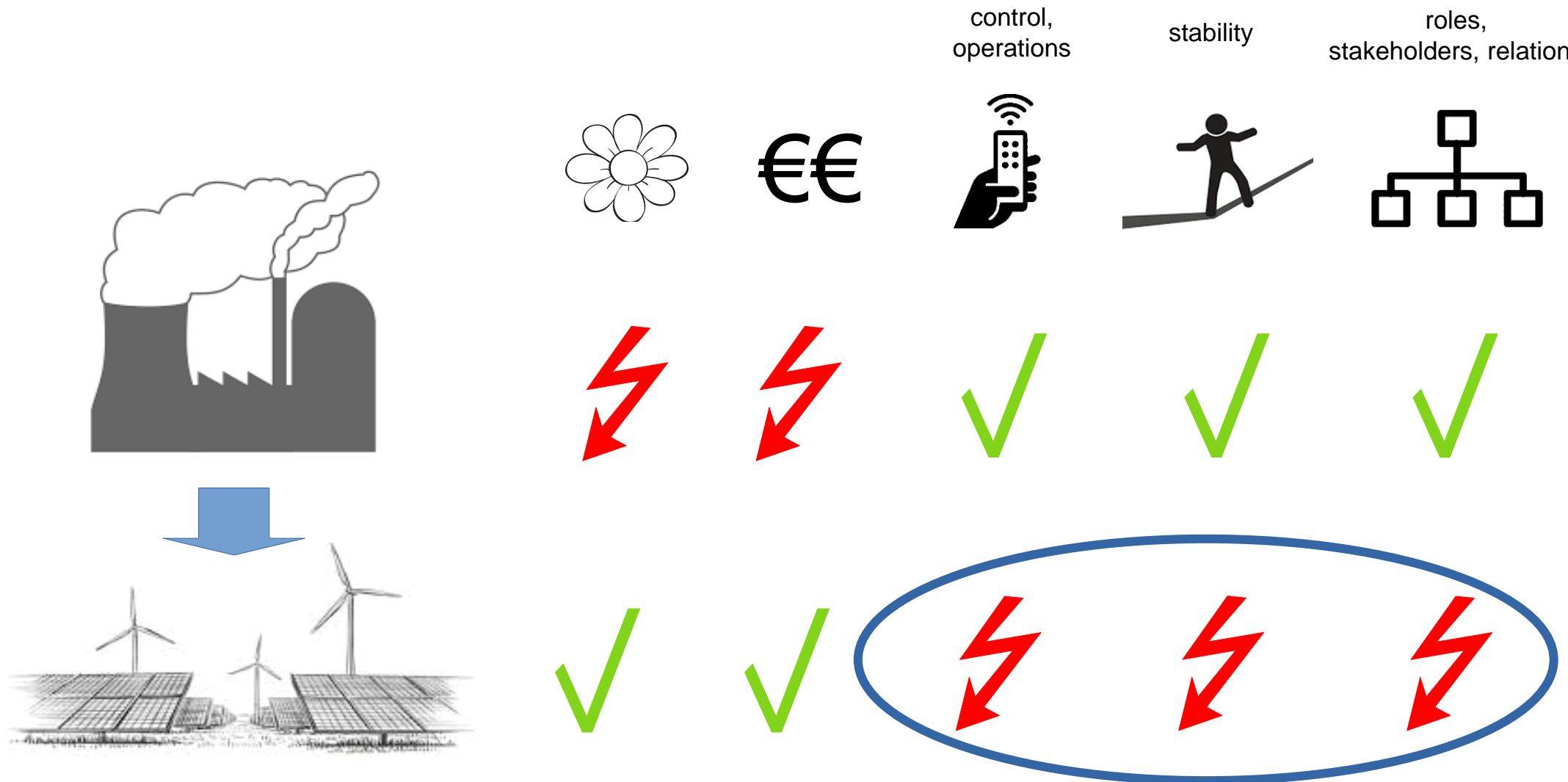
- **Part A: Introduction to co-simulation**
  - What is co-simulation?
  - Why is co-simulation relevant for the assessment of future energy systems?
- **Part B: Co-simulation with mosaik**
  - Basics of using mosaik for co-simulation
- **Part C: Example multi-energy network application**
  - Assessment of a coupled thermo-electrical network



# Part A: Introduction to co-simulation



# Decarbonization of our Energy System



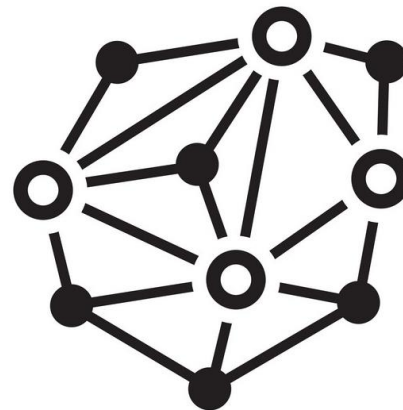
# The Future Energy Systems



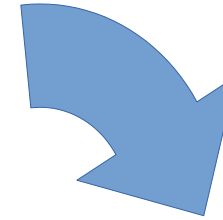
Decarbonized,  
renewable



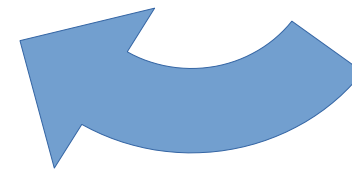
Digital



Distributed



Integrated

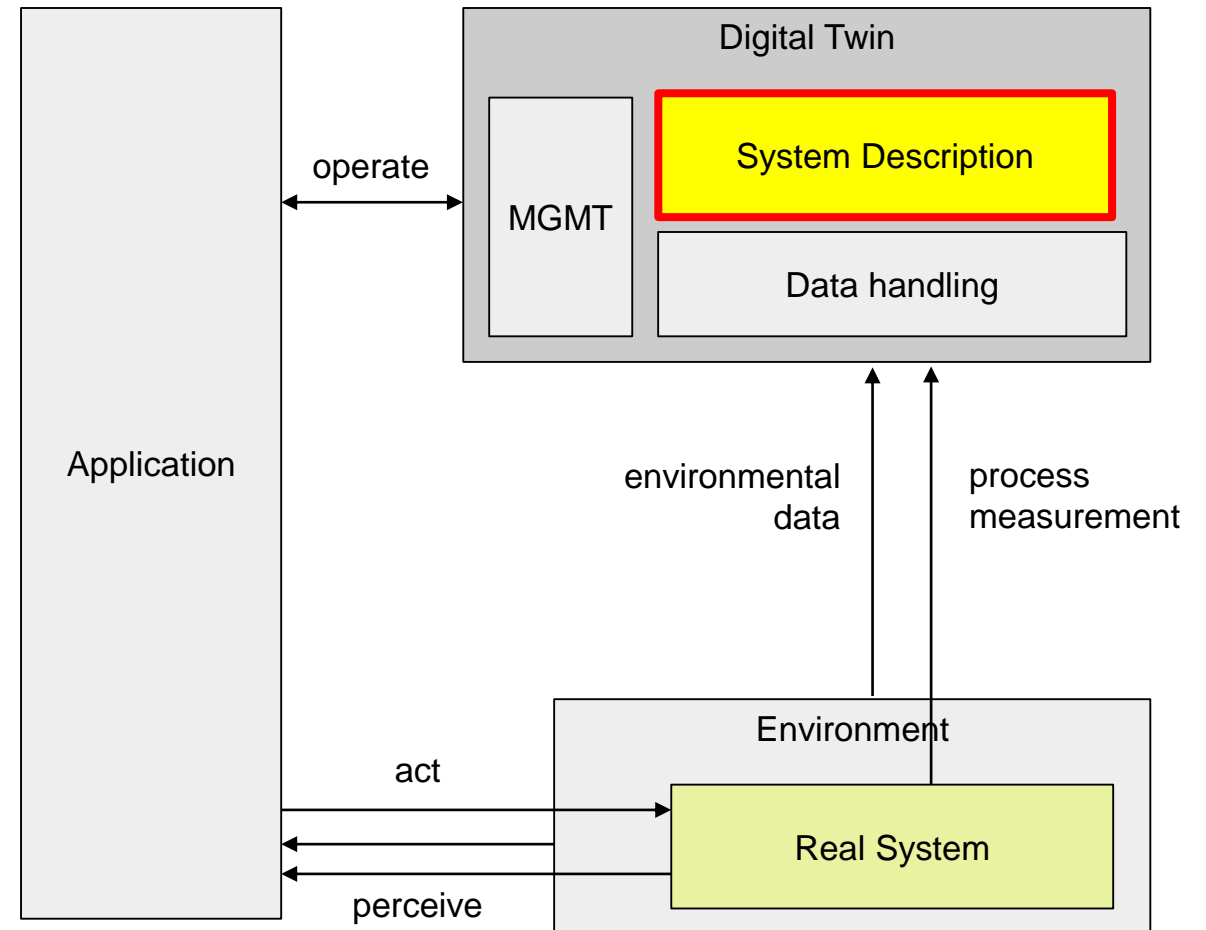


## Planning and operations

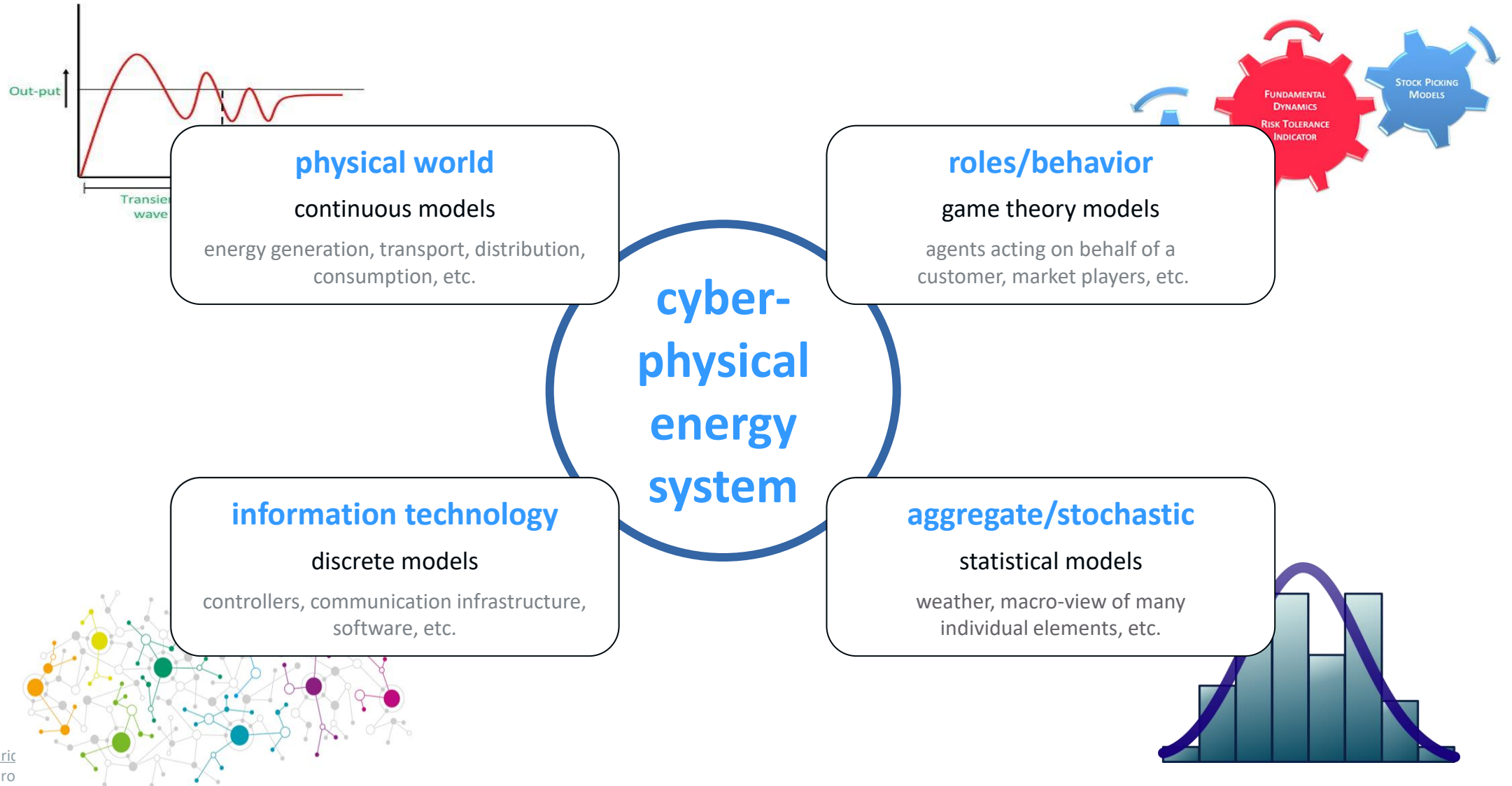
- Complex and large systems
- Difficult Decisions
  - Multi-disciplinary
  - Uncertainty
  - Complexity vs. time constraints
  - Multi-stakeholder
  - “Back-of-an-envelope”...?

# Support by numerical models

- During design phase
  - Dimensioning
  - Stability
  - Interoperability check
- Support of operations
  - Sanity/safety check
  - Digital Twins
- Post-mortem forensics



# Describing the future Energy Network(s)





# Future Energy System is...

- **Cyber-physical** (discrete+continuous)
- **Multi-physical** (heat, power, gas,...)
- **Multi-timescale** (power electronics, hydraulics,...)
- **Complex** (hidden states, emerging behavior)
- **Probabilistic** (rare high impact events)

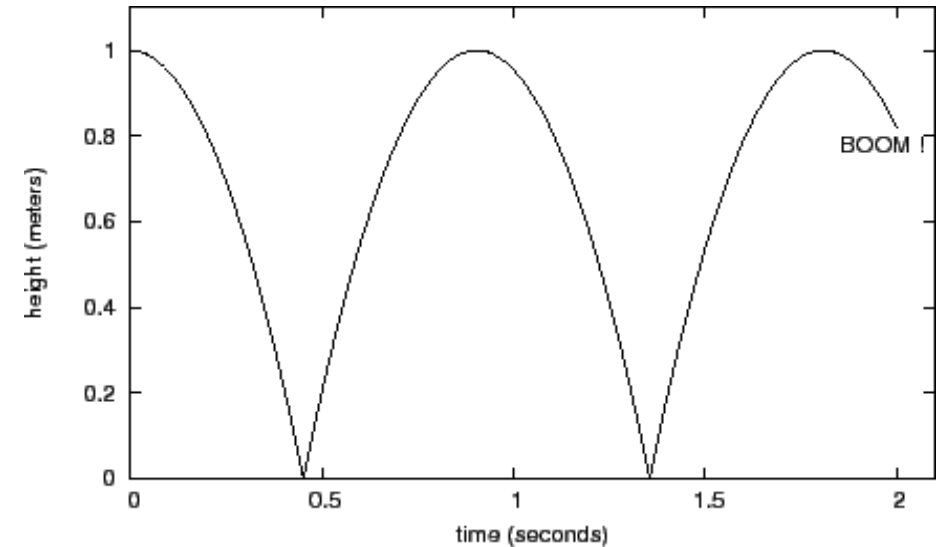
→ how to model...?



Good question, Einstein ...

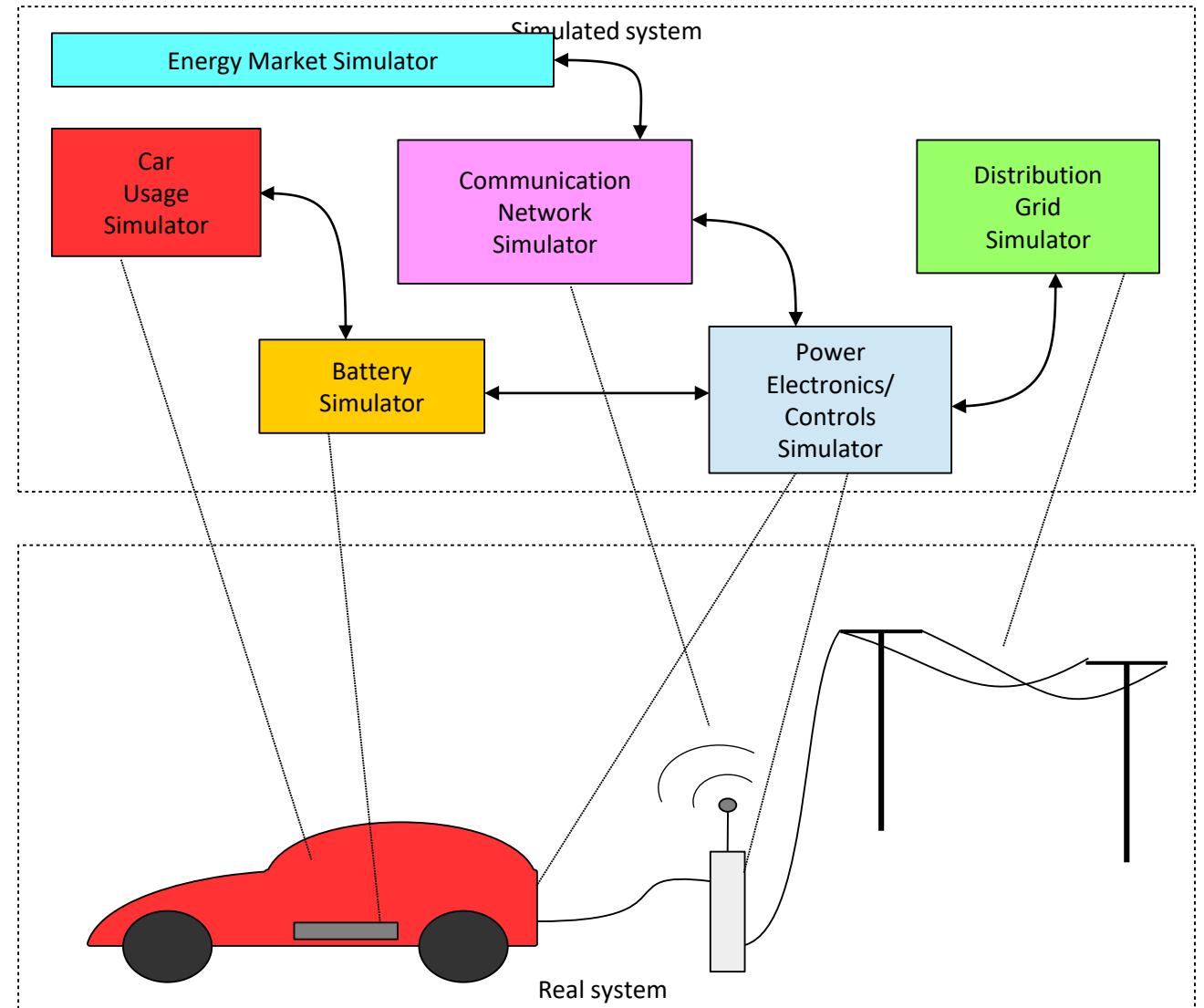
# Options to model/simulate

- (1) Squeeze all submodels into one tool, language, solver, method
  - n-1 submodels in wrong language
  - Tedious, Error prone
  - Brutal simplifications
- (2) Universal tool
  - Universal language, solver, etc.
  - Performance problems
- (3) Combine specialized languages, solvers, tools?



# Connecting models/tools!

- **Combine** numerical models and run solvers **concurrently**
- Solve **collaboratively**
- Multi-disciplinary, **connected** problems and teams possible
- “**Co-Simulation**”



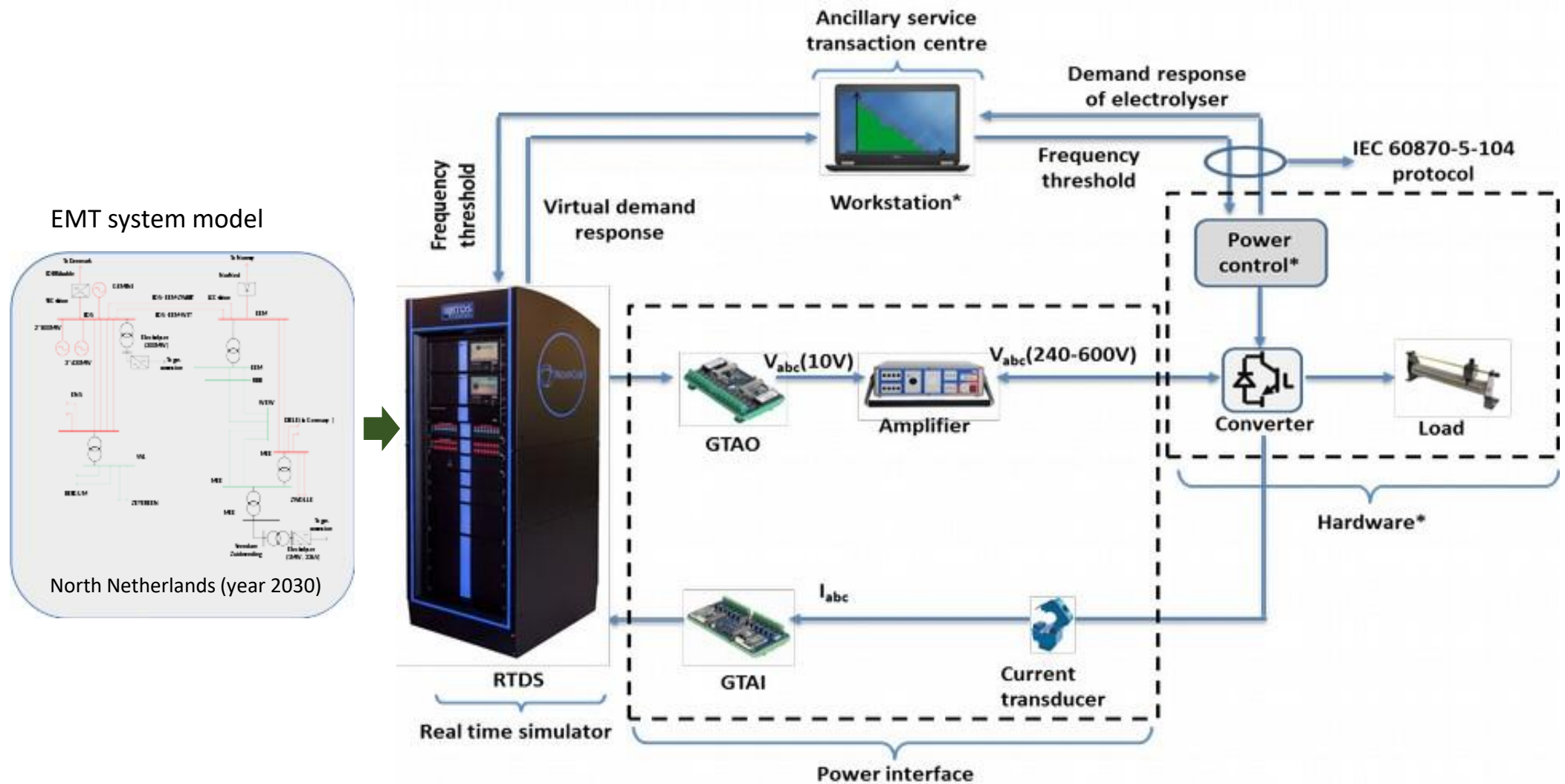
# Real-time Co-Simulation

- Run in real-time (not faster, not slower)
- Implicit synchronization
- Coupled (physical) variables
- In the loop
  - Controller
  - Power HW
  - People
  - Software



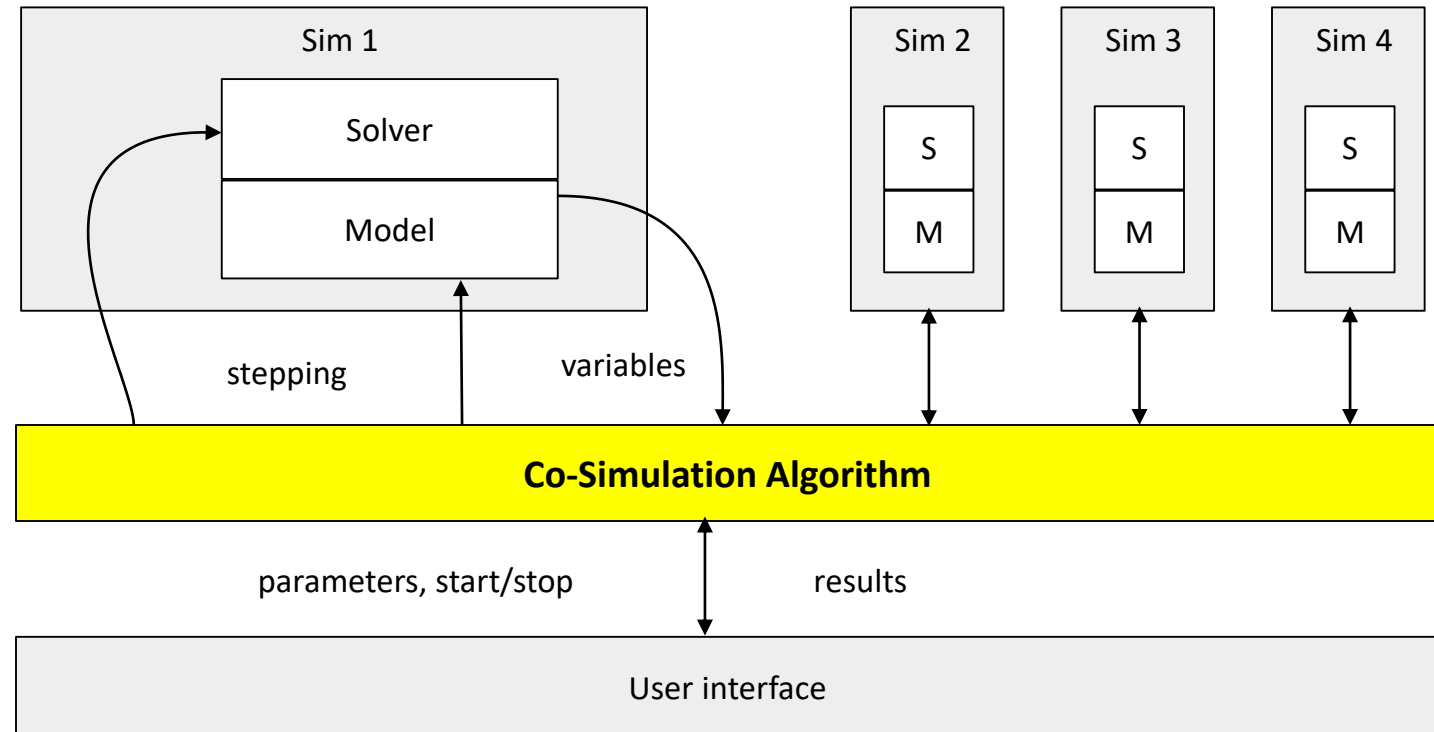
Source: RTDS Technologies, "Real time digital simulation: Modelling renewable energy applications," Feb. 2018.

# RT: Ancillary Services from Hydrolyzers



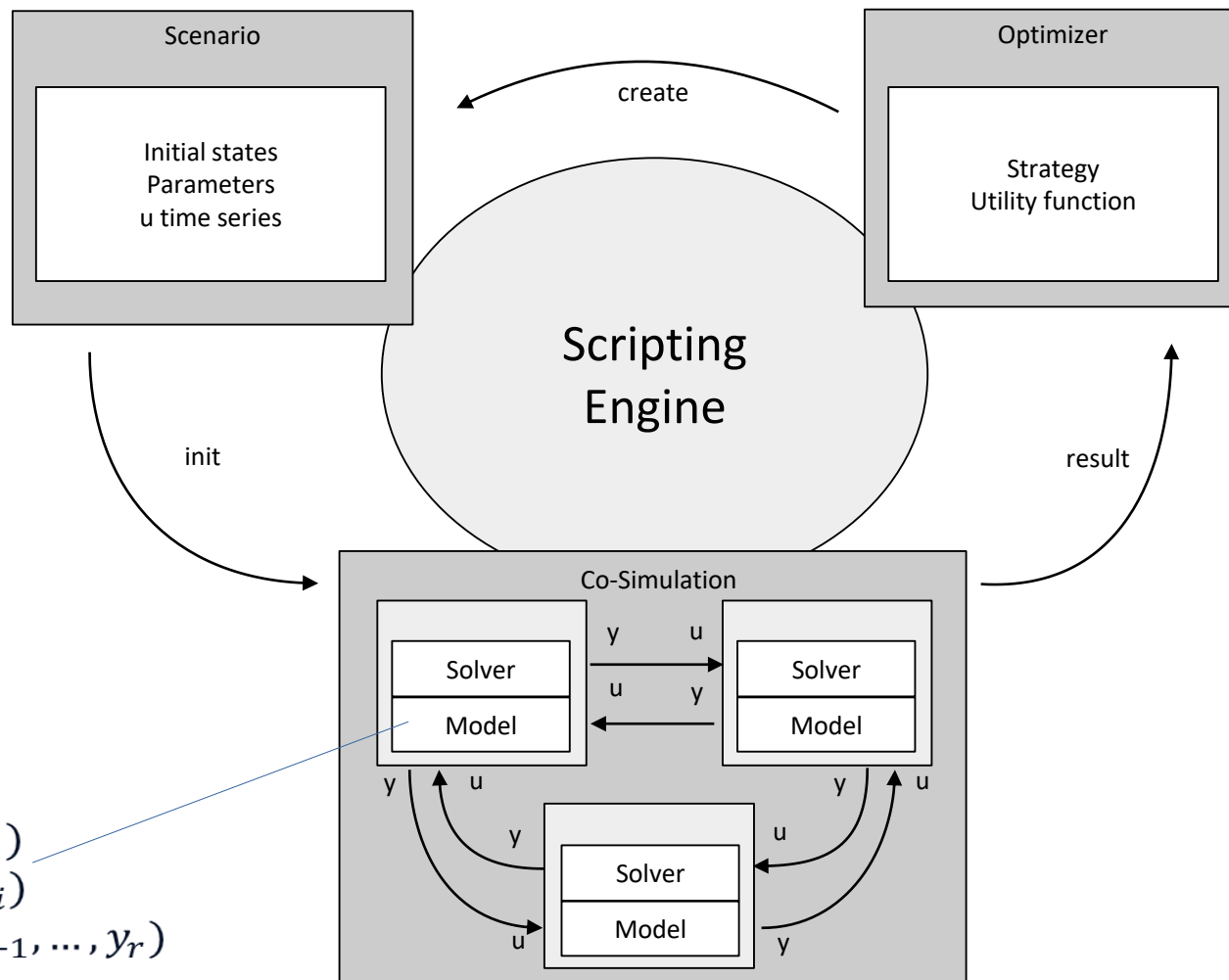
# Non-real time: Co-Simulation Algorithm

- Initialize simulators
- Exchange variables
- Sync time stepping
- User interaction



# Co(uple)d Simulation Workflow

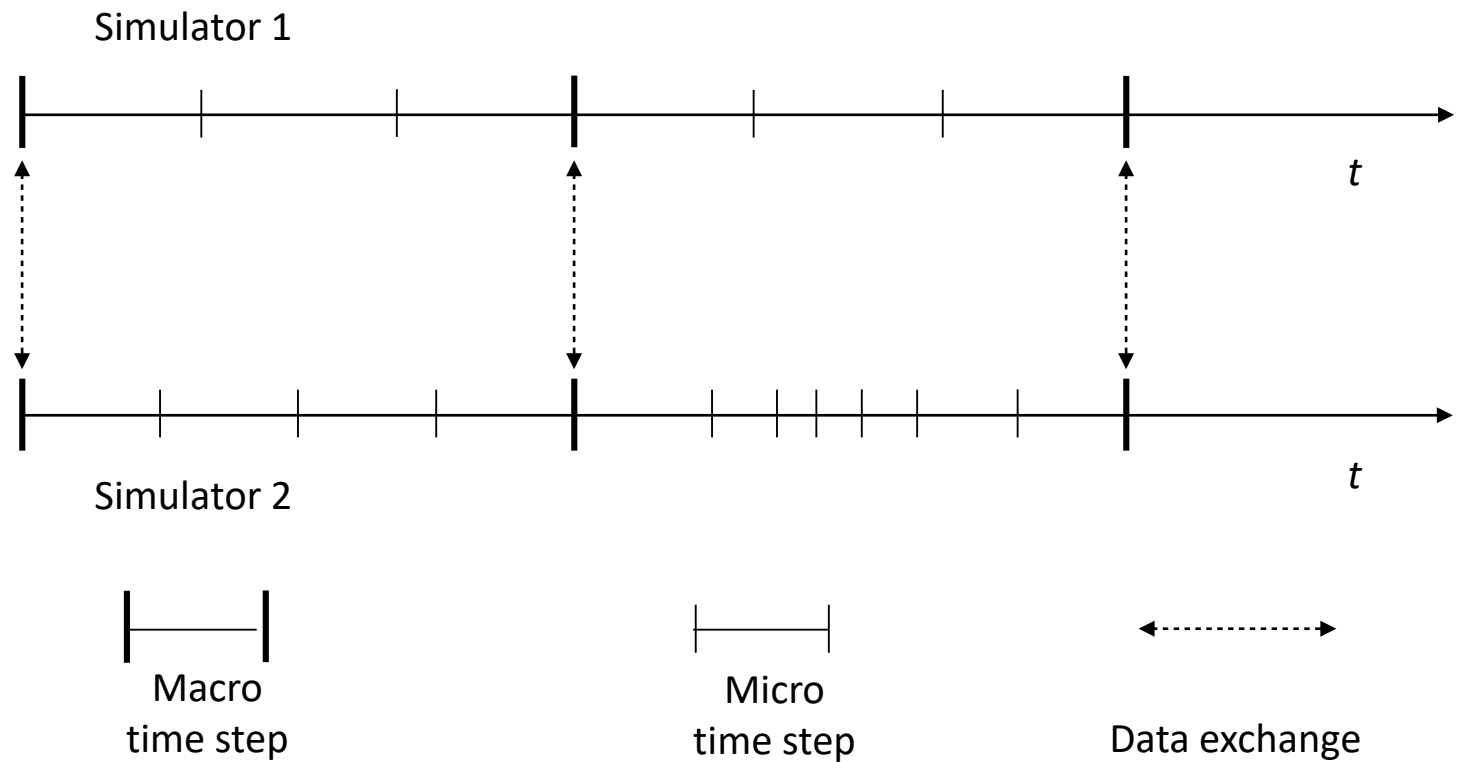
- Multiple simulators
- Multiple models
  - Coupled DAEs
- How to link/sync?
- Scenario Handling?
- Interfaces?



$$\begin{aligned} \dot{x}_i &= f_i(t, x_i, u_i) \\ y_i &= g_i(t, x_i, u_i) \\ u_i &= c_i(y_1, \dots, y_{i-1}, y_{i+1}, \dots, y_r) \\ i &= 1, \dots, r \end{aligned}$$

# Synchronization

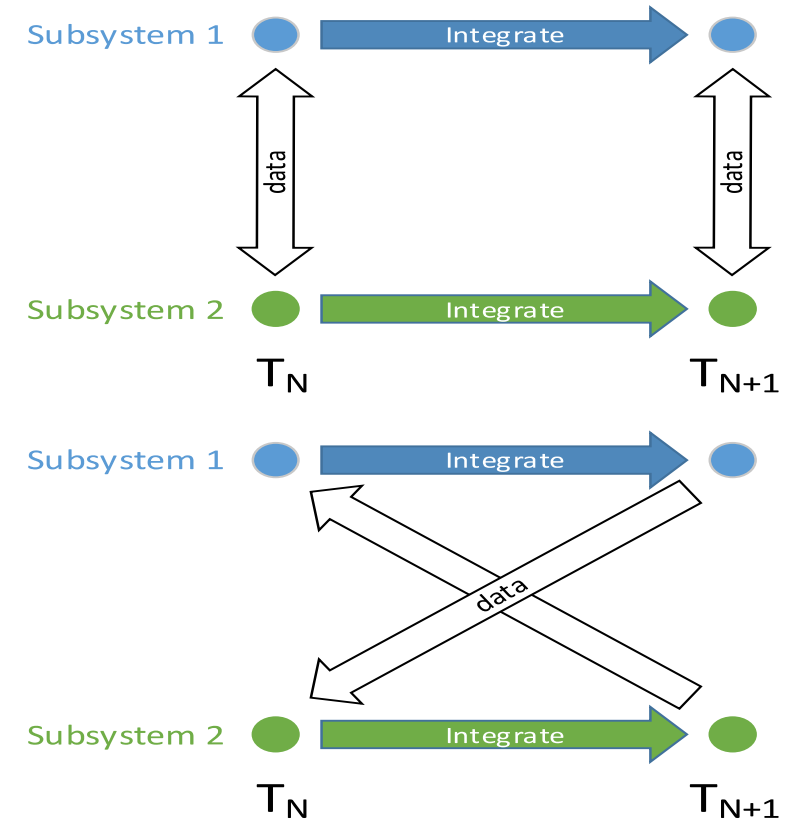
- Sync points = Macro steps
- Exchange variables





# Coupling principles

- Explicit coupling exchanges data at every external step once
- Implicit coupling iterates each external step until the system converges
- # external steps determines error



# Co-Simulation Bottom Line

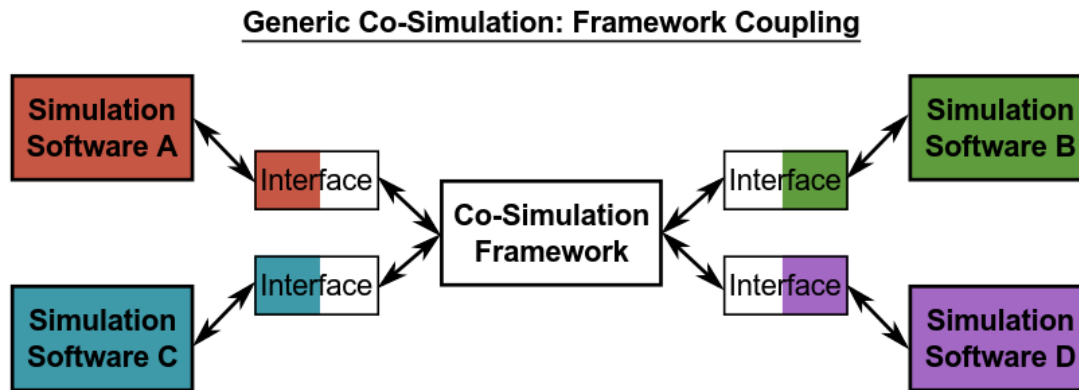
- Coupled, coordinated simulators
- Multi-everything possible...
- RT co-sim vs. non-RT co-sim
- Scenario handling?
- Performance?



# Part B: Co-simulation with mosaik



# Co-simulation framework mosaik



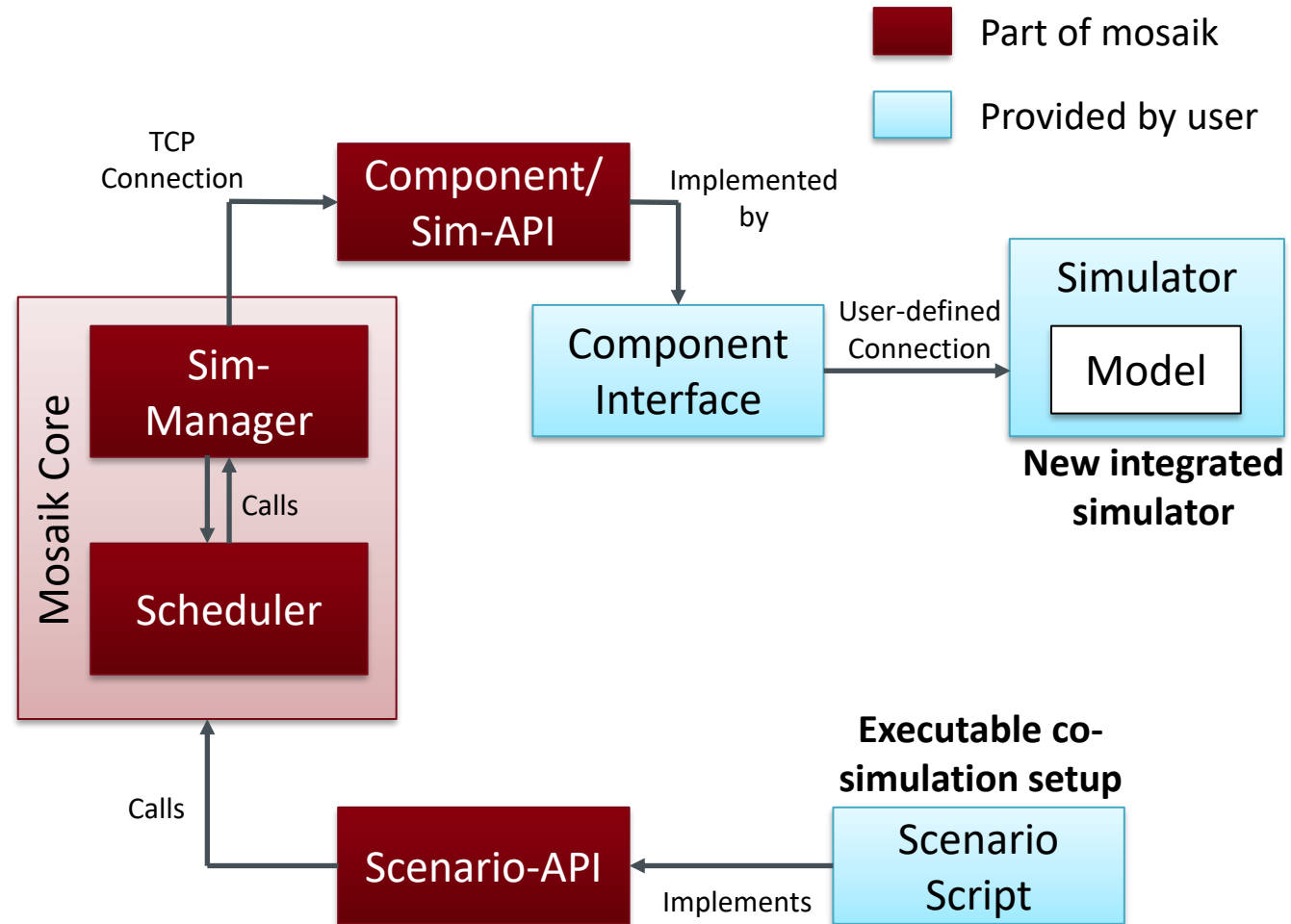
- Main features
  - Integration and re-use of heterogeneous simulation components
  - Specification of simulation scenarios
  - Coordination of data exchange and scheduling
  - Discrete time and discrete event simulation
- Open source (LGPL): [gitlab.com/mosaik](https://gitlab.com/mosaik)
- Documentation: [mosaik.readthedocs.io](https://mosaik.readthedocs.io)

# Mosaik ecosystem

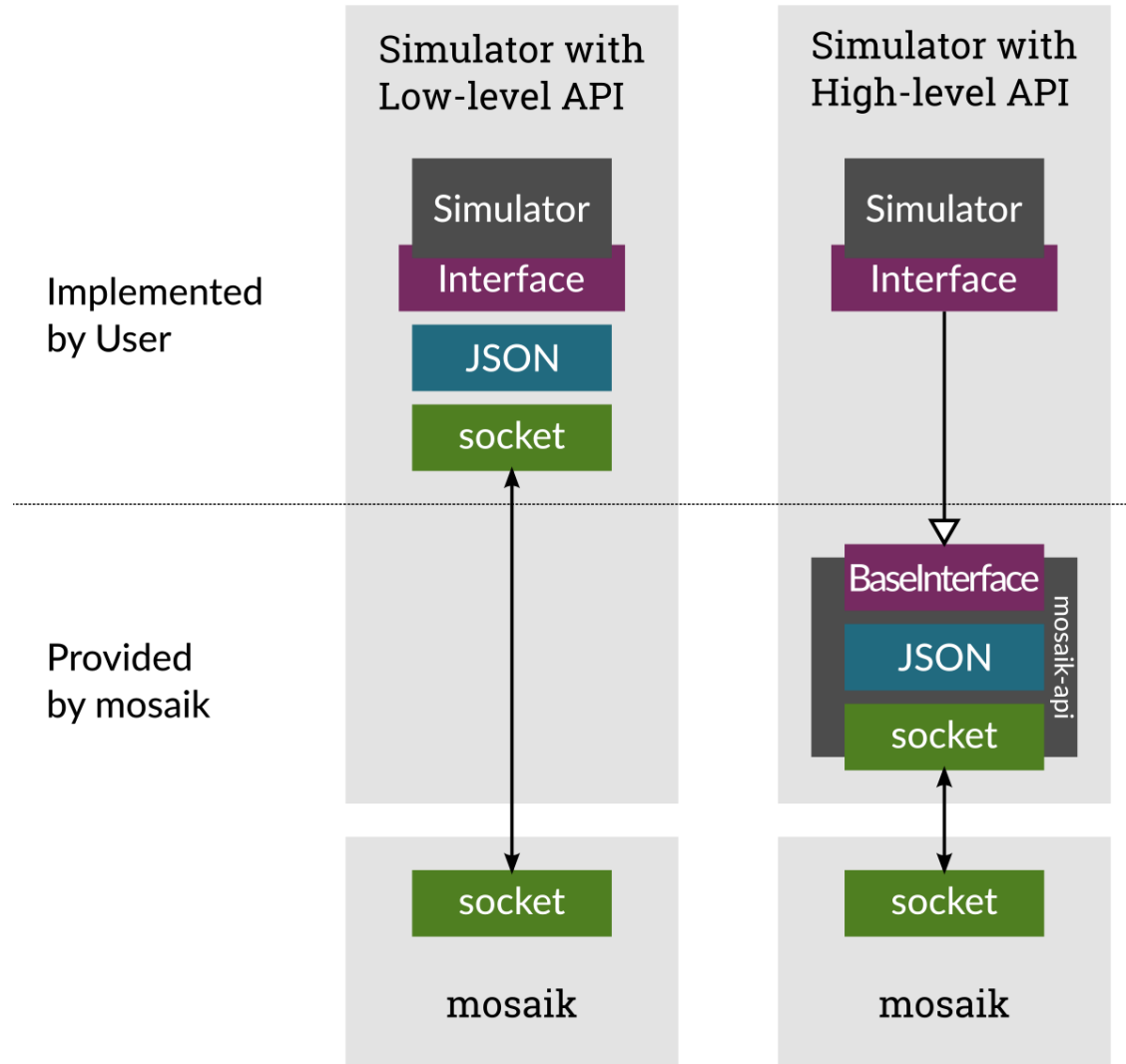
- Simulation models
- Interfaces for simulation tools (e.g., pandapower, PowerFactory)
- Wrappers for programming languages (e.g., Java)
- Wrappers for standard interface (e.g., fmi or OPC UA)
- Visualization and data storage (e.g., HDF5, Influx+Grafana)



# Mosaik architecture

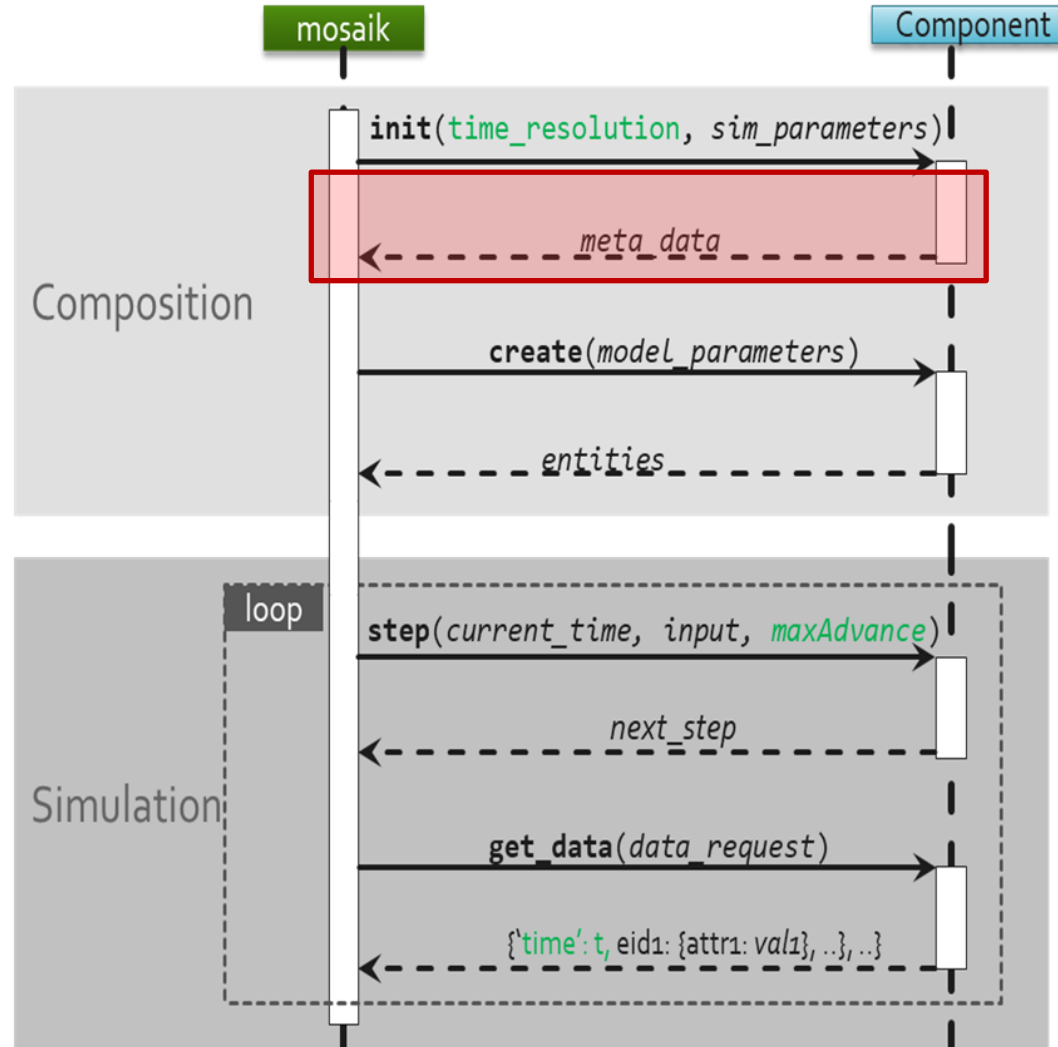


# Component API of mosaik



- **Low-level API:** Every tool supporting TCP-sockets and JSON
- **High-level API:** Several easier solutions for specific tools
  - E.g., create a subclass of `mosaik_api.Simulator`

# Component API of mosaik





# Meta data returned by init()

```
{  
  'api_version': 'x.y',  
  'type': 'time-based'|'event-based'|'hybrid',  
  'models': {  
    'ModelName': {  
      'params': ['param_1', ...],  
      'attrs': ['attr_1', ...],  
      'trigger': ['attr_1', ...],  
      'non-persistent': ['attr_2', ...],  
    },  
    ...  
  },  
}
```

## Simulator's type:

- **Time-based:** Traditional mosaik 2 simulator with self-stepping and persistent data
- **Event-based:** Triggered by all attributes and non-persistent data
- **Hybrid:** Attribute lists within 'trigger' and 'non-persistent' specify the behavior

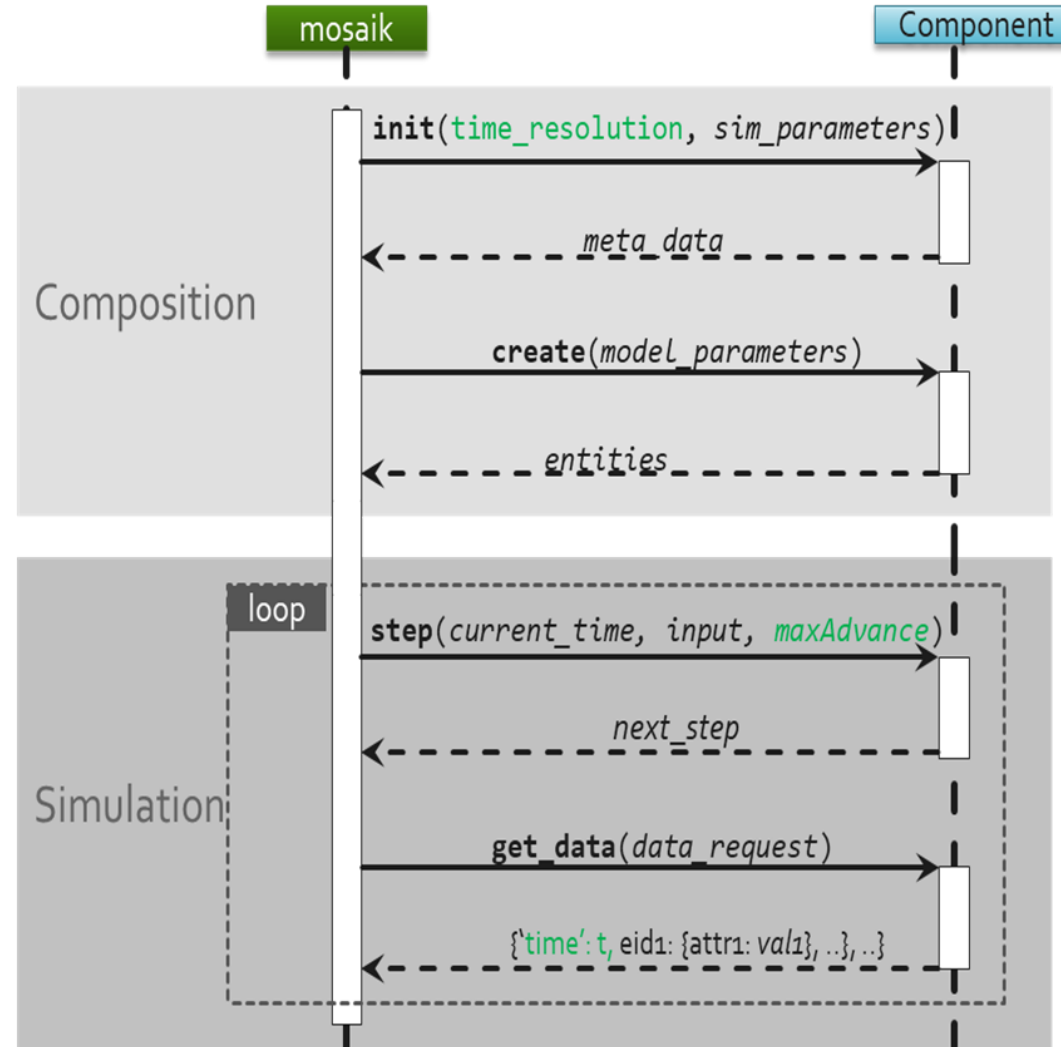
## Triggering attributes (optional):

- simulator will be stepped automatically as soon as there's new data available for this attribute

## Non-persistent or transient attributes (optional):

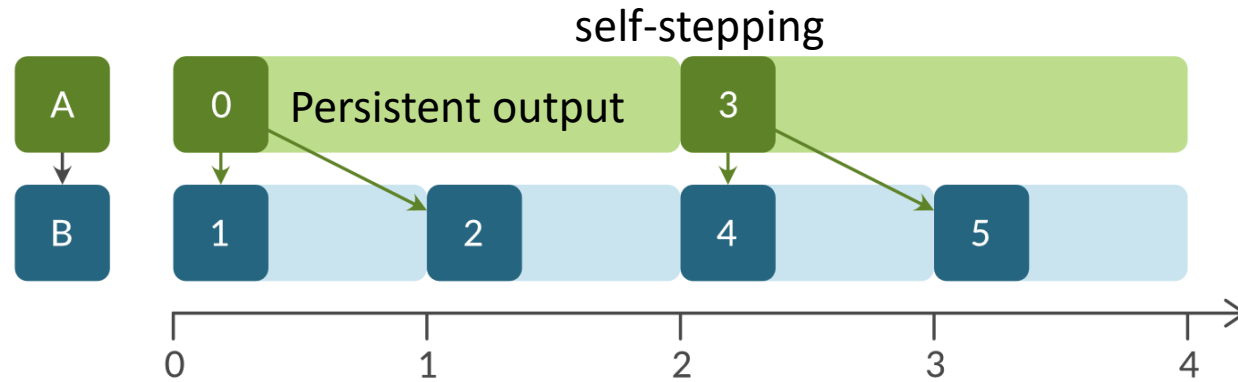
- data of these attributes is only valid for a single time step

# Component API of mosaik

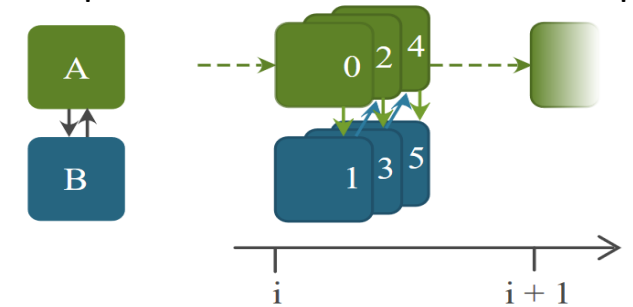


# Scheduling/Synchronization

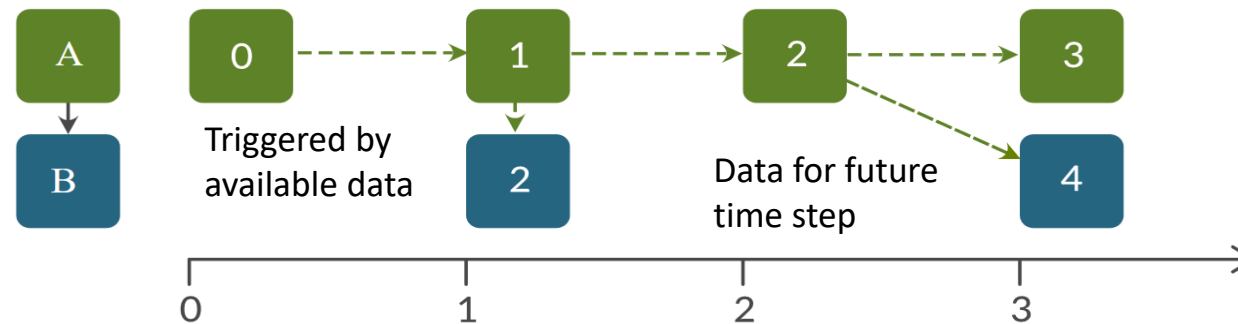
- Time-based



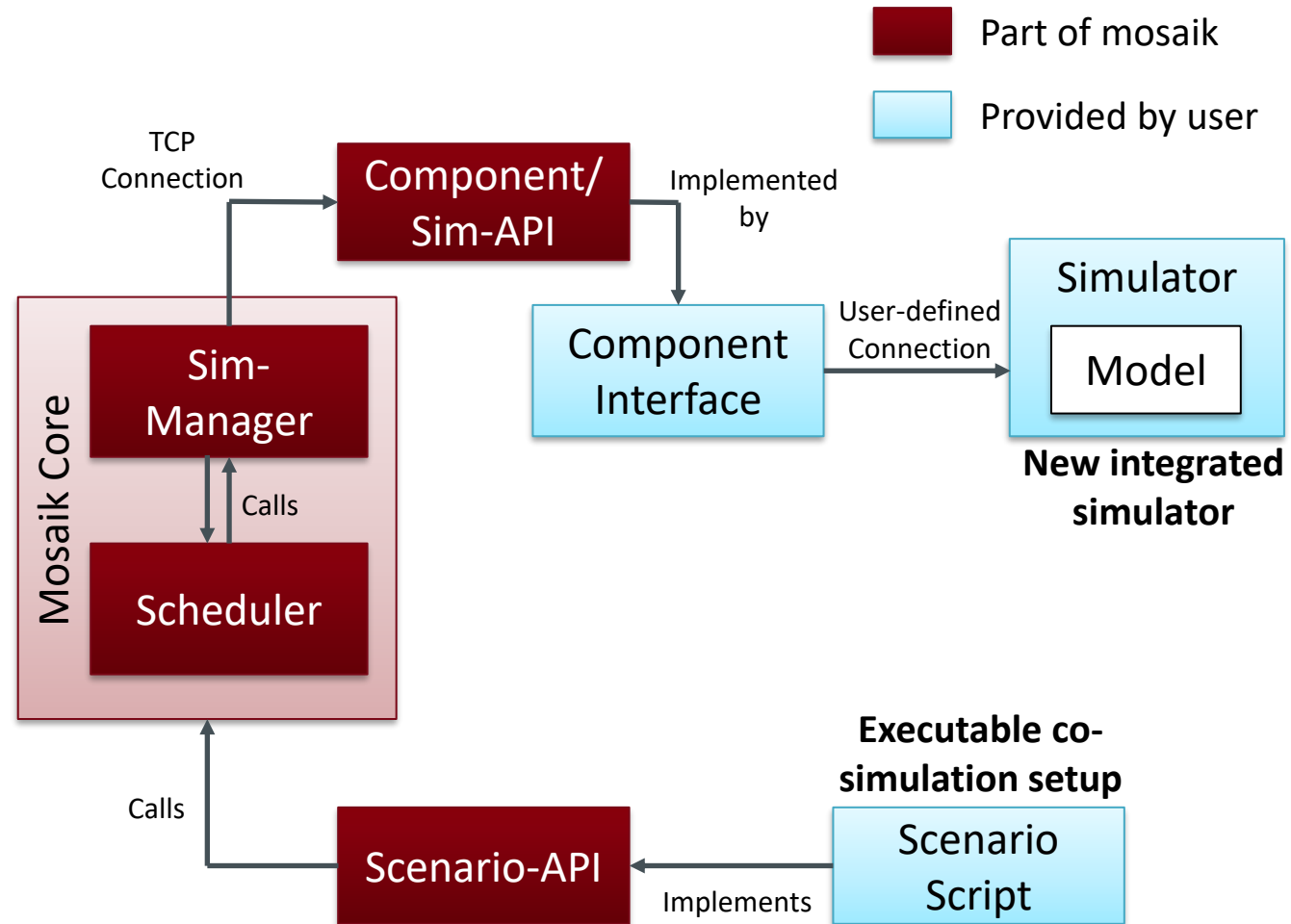
Superdense time / Same time loop:



- Event-based / hybrid



# Mosaik architecture



# Scenario API

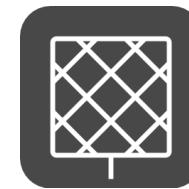
- 1. Provide addresses of simulators to mosaik

```
import mosaik

sims = {grid: Python,
        house: Java,
        PV: MATLAB,
        control: Python}

world = mosaik.World(sims)
```

- Executable Python script
- Presented in pseudo code

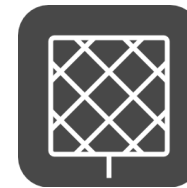


# Scenario API

- 2. Start simulator processes

```
gsim = world.start(grid)
hsim = world.start(house)
pvsim = world.start(PV)
csim = world.start(control)
```

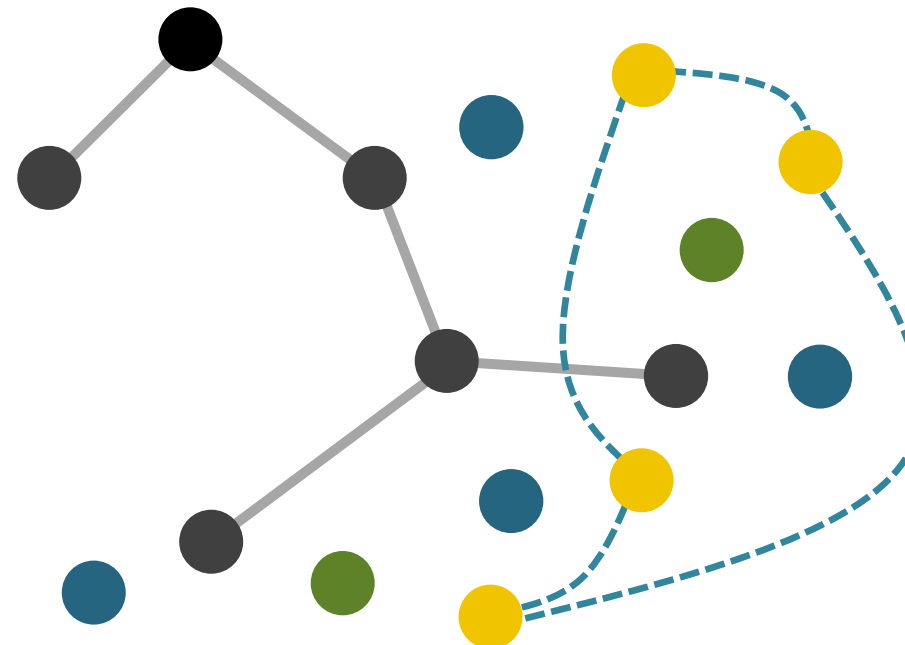
**Simulator:** Programm which controls models of a specific type or acts as an interface to external tools (e.g. pandapower, HDF5, ...)



# Scenario API

- 3. Instantiate model entities & parameterize

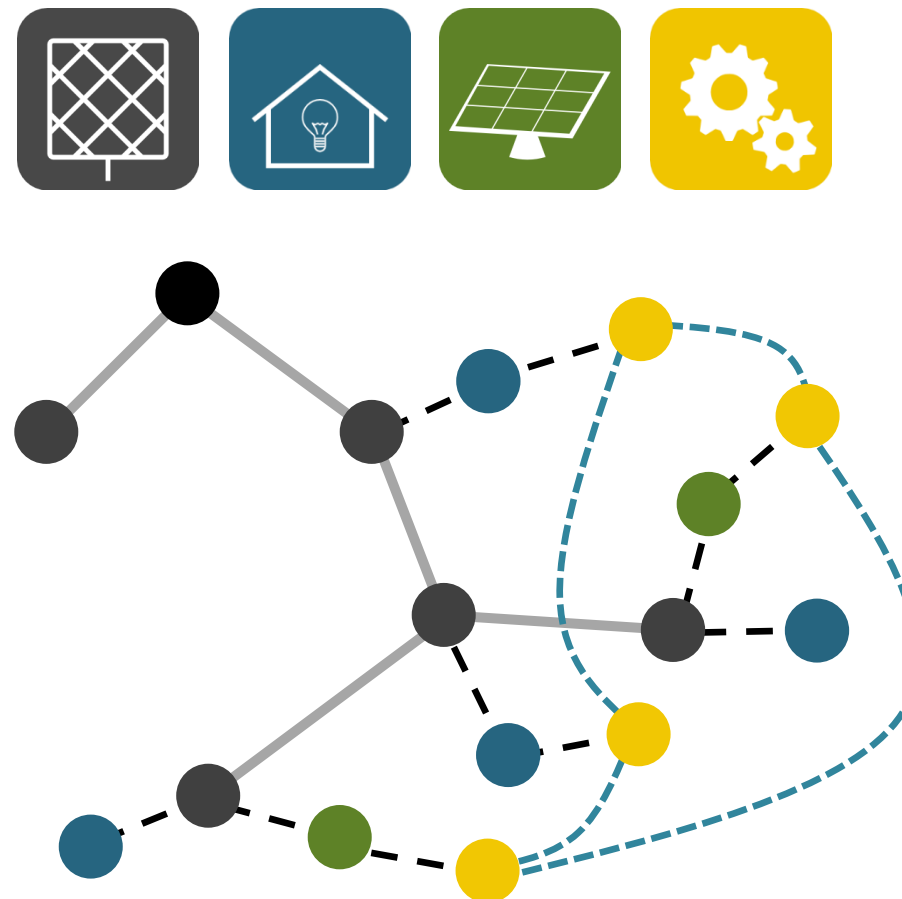
```
grid =  
gsim.create(gridmodel,  
            param=topology)  
  
houses =  
hsim.create(housemodel, 4)  
  
pvs =  
pvsim.create(pvmodel, 2,  
            param=size)  
  
ctrl =  
csim.create(MAScontrol)
```



# Scenario API

- 4. Connect models via dataflow

```
connect(houses, grid,  
       'active power')  
  
connect(pvs, grid,  
       'active power')  
  
connect(ctrl[1&2],  
       houses[1&2],  
       'setpoint')  
  
connect(ctrl[3&4], pvs,  
       'setpoint')  
  
world.run(3600) Execute!
```





# Demo

- Tutorials as JupyterLab:  
<https://gitlab.com/mosaik/examples/mosaik-tutorials-on-binder>
- Tutorials in Documentation:  
<https://mosaik.readthedocs.io/en/latest/tutorials>
- More Demos:  
<https://gitlab.com/mosaik/examples>



# Summary

- Integration and re-use of heterogeneous simulation components
- Flexible specification of simulation scenarios
- Coordination of data exchange and scheduling
- Discrete time and discrete event simulation
- Open source (LGPL)
- Extensive ecosystem of models, interfaces and wrappers



**Code:**

<https://gitlab.com/mosaik>

**Documentation:**

<https://mosaik.readthedocs.io/>

**Get in contact:**

Mailing List: [mosaik-users@lists.offis.de](mailto:mosaik-users@lists.offis.de)

Direct mail: [mosaik@offis.de](mailto:mosaik@offis.de)

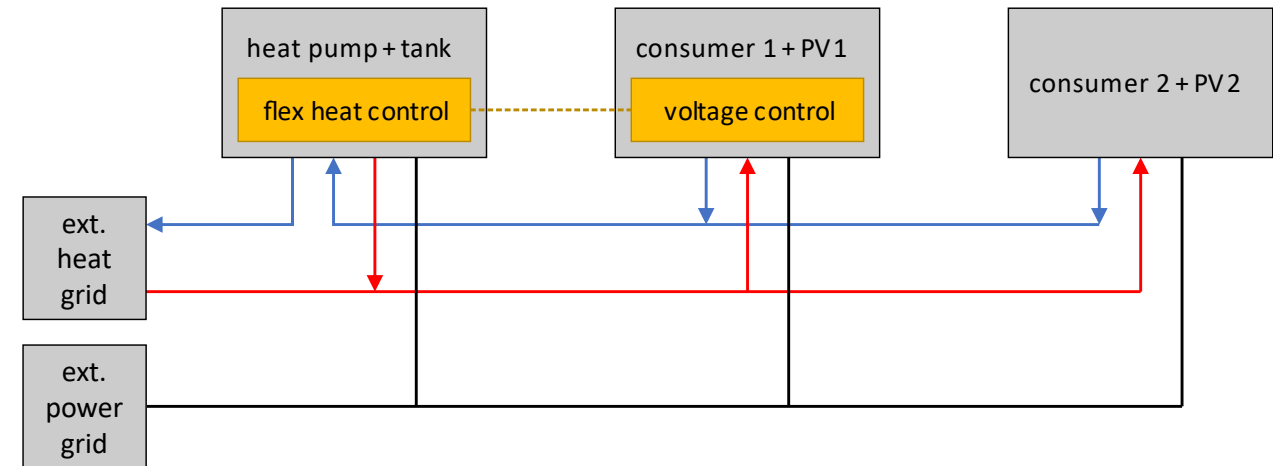
Open issues in GitLab

# Part C: Example multi-energy network application



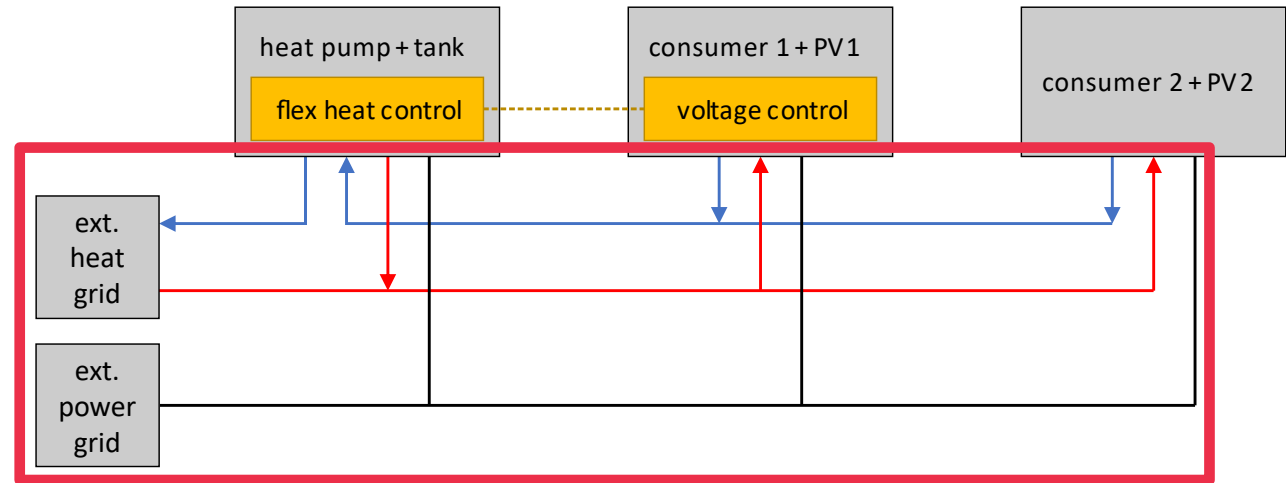
# Example Multi-Energy Network Application (1/5)

- system configuration overview:
  - electrical network
  - thermal network
  - consumers
  - generation units
  - power-to-heat facility
- simple on purpose: focus on concept and use of co-simulation for multi-energy systems



# Example Multi-Energy Network Application (2/5)

- electrical network:
  - 2 consecutive lines (0.3 km each)
  - connected to external grid
- thermal network:
  - 3 main consecutive pipes (supply and return, 0.5 km each)
  - connected to external grid



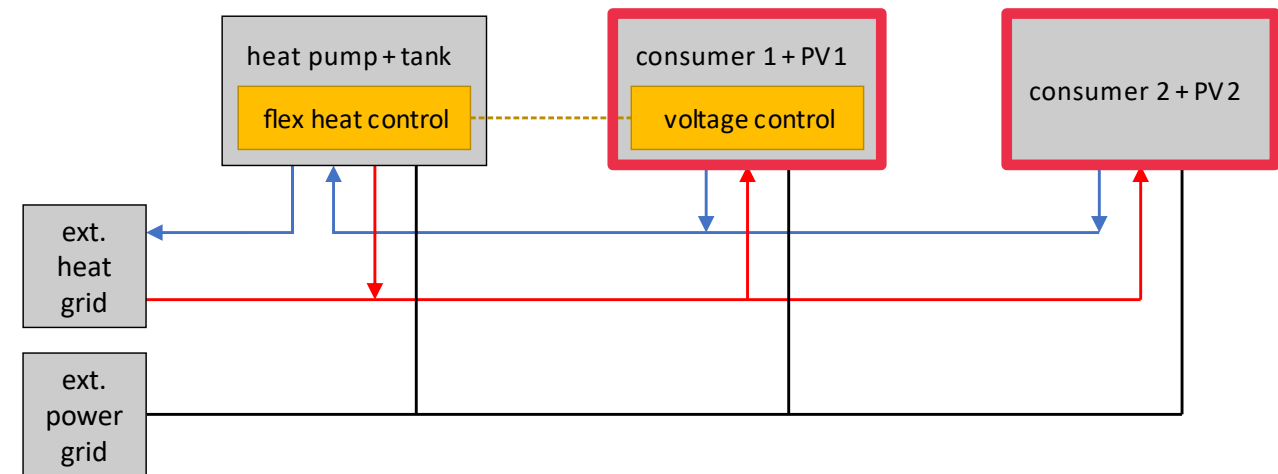
# Example Multi-Energy Network Application (3/5)

- consumers:

- 2 consumers connected to both networks
- aggregated loads (electrical and thermal) of an urban quarter

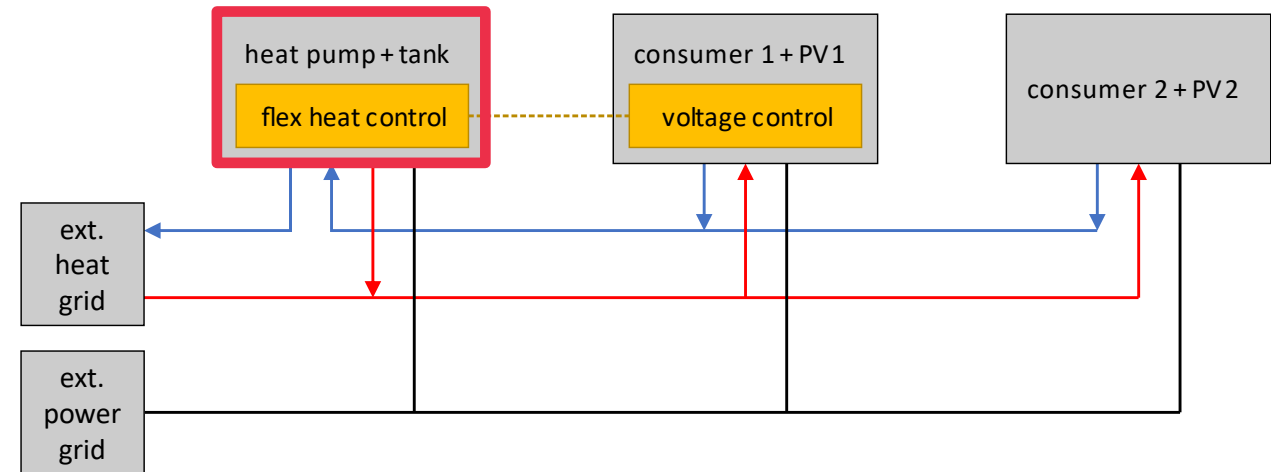
- generation units:

- 2 PV systems with  $150 \text{ kW}_{\text{el, peak}}$  and  $50 \text{ kW}_{\text{th, peak}}$



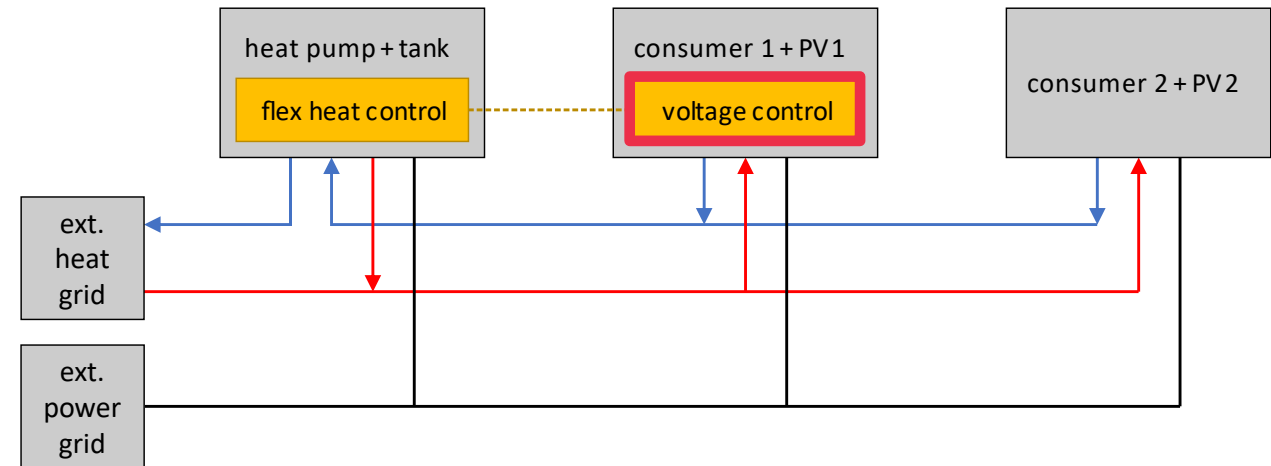
# Example Multi-Energy Network Application (4/5)

- power-to-heat facility
  - heat pump and hot water storage tank
  - couples both networks
- flex heat controller operates the power-to-heat facility:
  - heat supply is covered entirely through the external grid
  - or
  - power-to-heat facility supports by discharging the tank



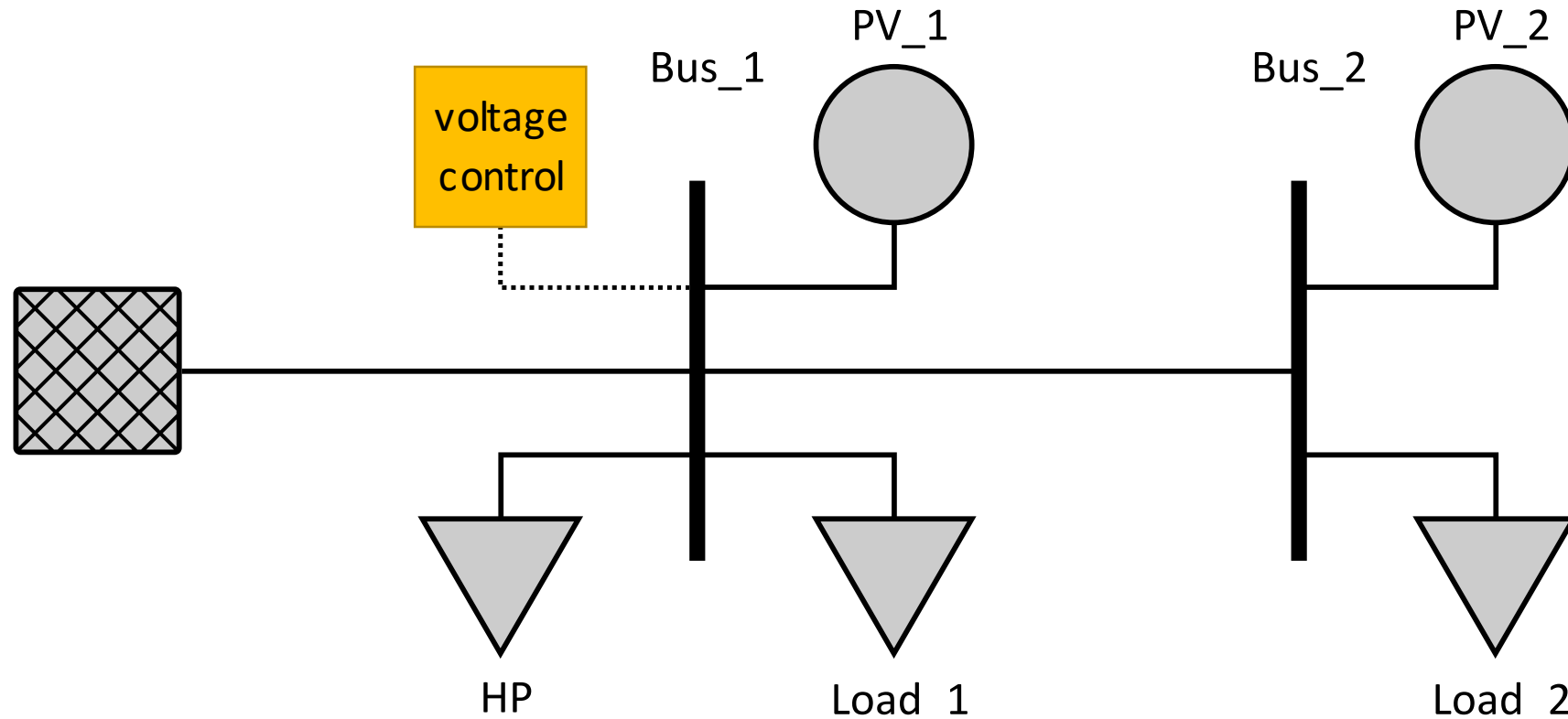
# Example Multi-Energy Network Application (5/5)

- voltage controller uses power-to-heat facility as controllable load
  - voltage is monitored
  - the power consumption setpoint of the heat pump is adjusted
  - when activated, the heat pump is used to charge the tank with hot water

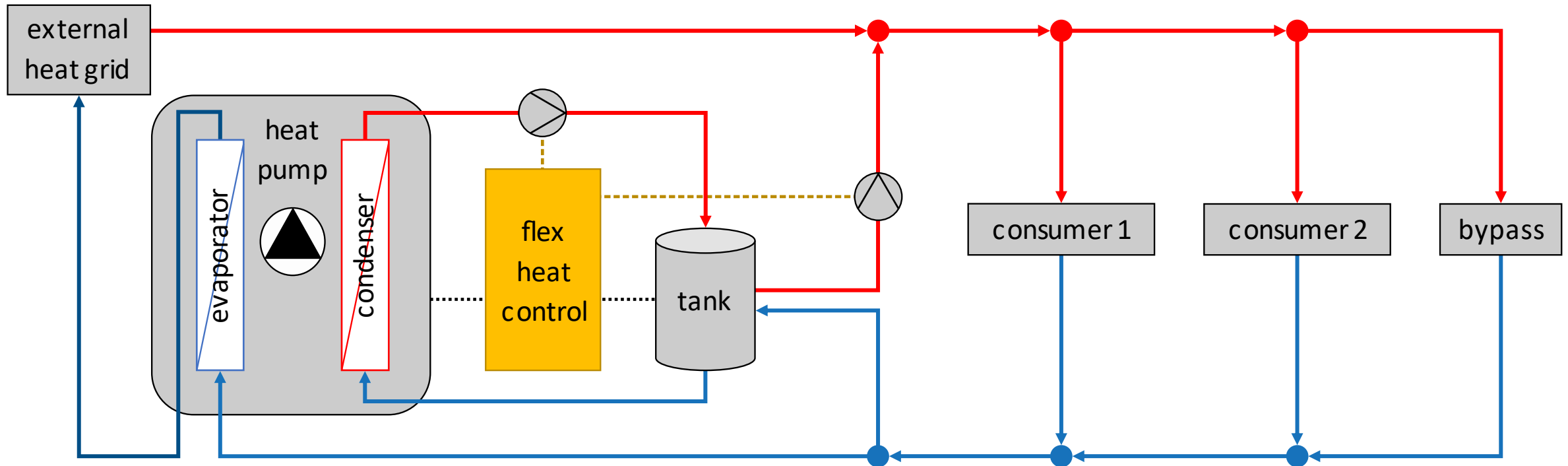




# Detailed View of Electrical Network

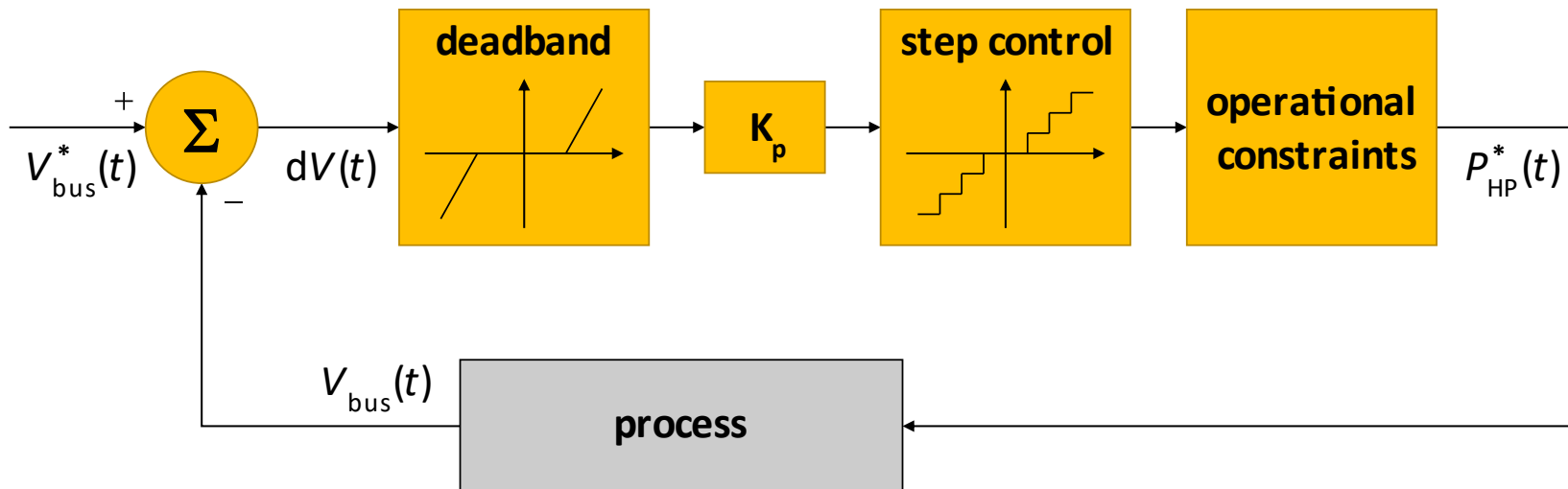


# Detailed View of Thermal Network



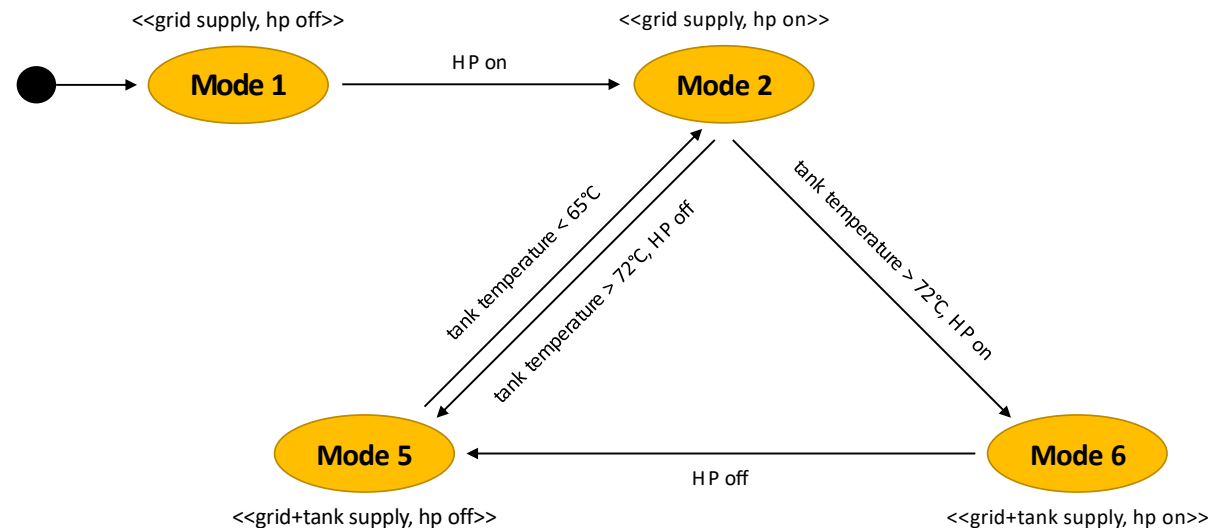
# Voltage Controller

- voltage at *bus\_1* is monitored
- power consumption setpoint of heat pump is adjusted to keep voltage within acceptable limits



# Flex Heat Controller

- regulate heat supply for thermal network
- operate power-to-heat facility to supply additional heat from the tank
- if required, heat pump is used to charge the tank, respecting the power consumption threshold from the voltage controller

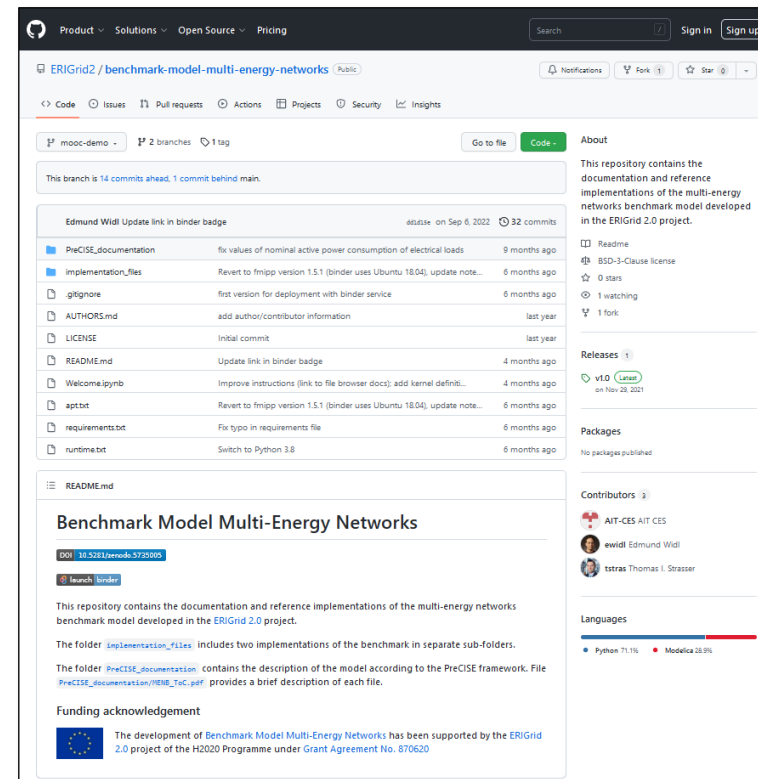


# Simulation Benchmark

- example application has been published as **simulation benchmark**:

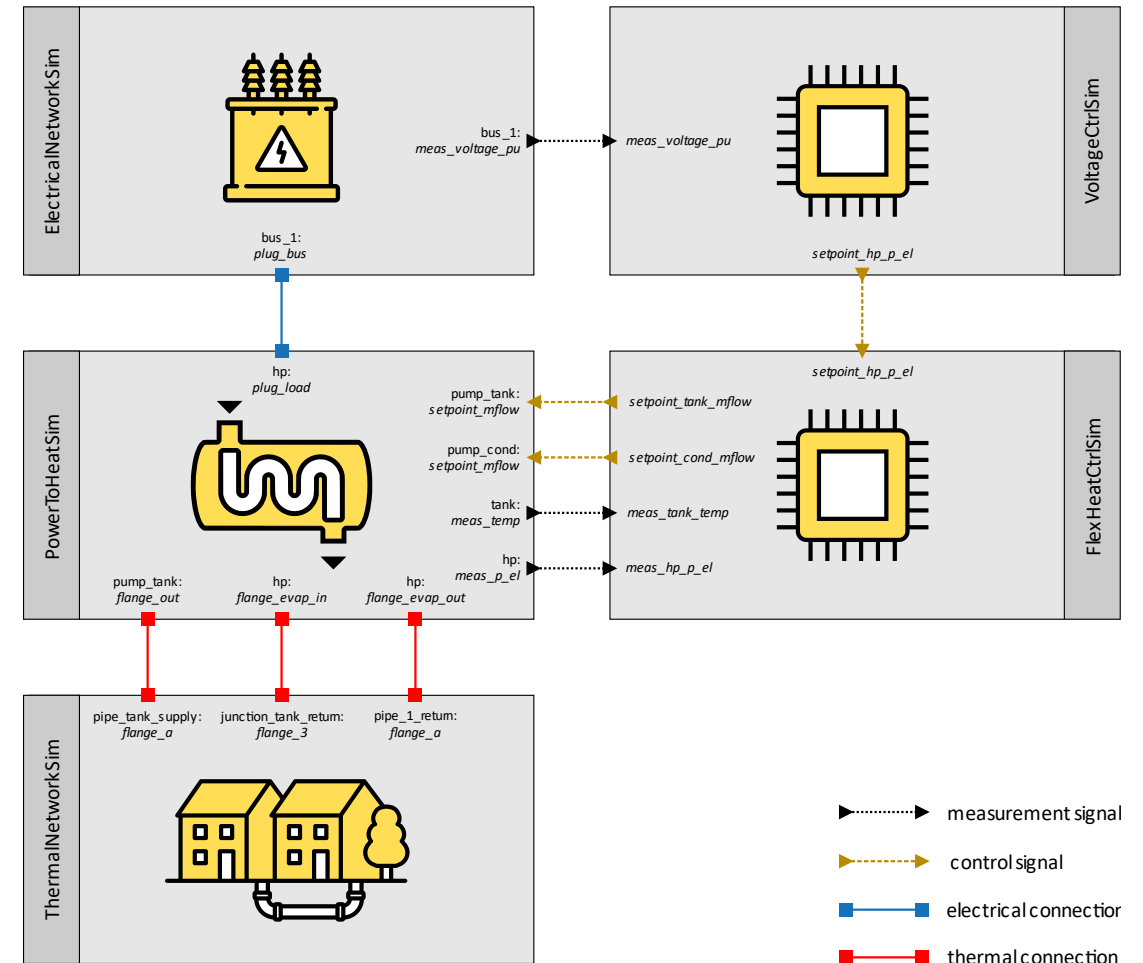
- detailed documentation
- 2 reference implementations of the simulation setup
- available at:

<https://github.com/ERIGrid2/benchmark-model-multi-energy-networks/tree/mooc-demo>



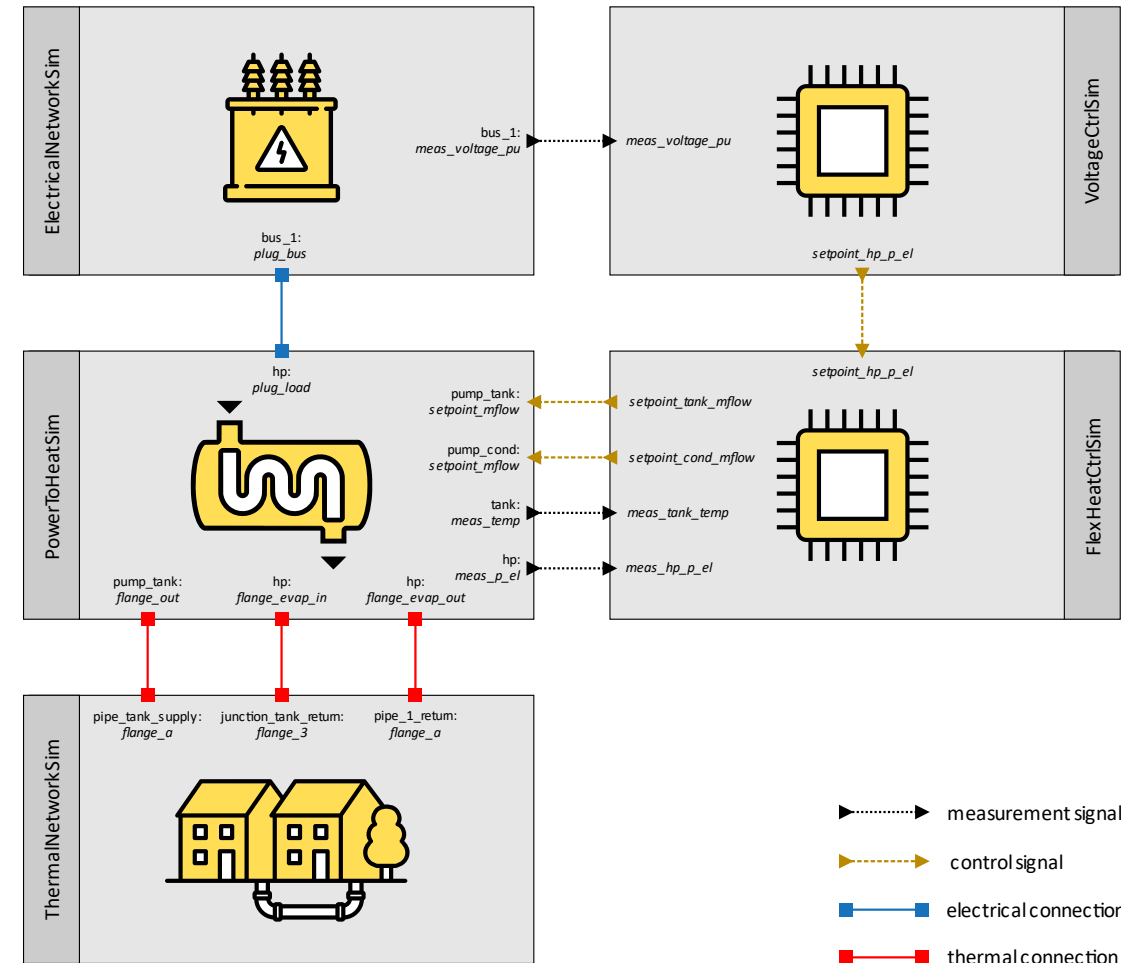
# Simulated Subsystems

- use co-simulation for simulating multi-energy systems:
  - different domains (power, heat, control) are covered by domain-specific simulation tools
  - partitioning of system under test into subsystems, each implemented by dedicated simulators



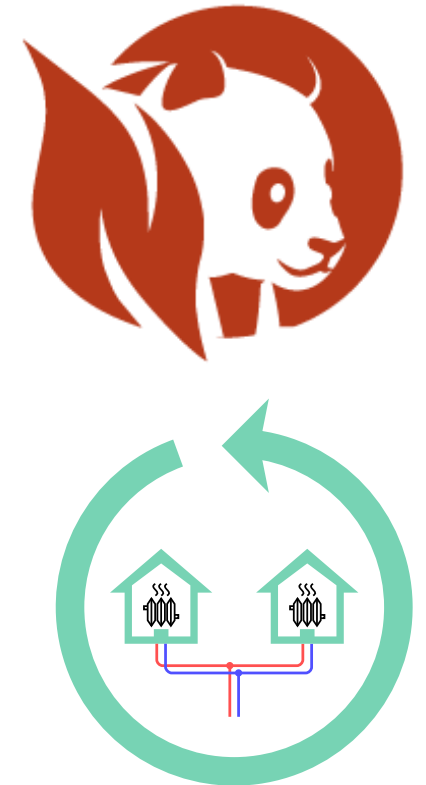
# Simulated Subsystems

- use the mosaik co-simulation framework:
  - pandapower for the electrical subsystem
  - standalone implementations of the controllers' logic in Python
  - pandapipes / DisHeatLib for the thermal domain



# Thermal Network Simulators

- simulation benchmarks provides 2 reference implementations using different approaches for modelling thermal networks:
  - **Python package pandapipes**
    - developed at the Fraunhofer Institute for Energy Economics and Energy System Technology (IEE) and the University of Kassel
  - **Modelica library DisHeatLib**
    - developed at the AIT Austrian Institute of Technology





# Comparison of Modeling Approaches (1/2)



*pandapipes*



*DisHeatLib*

- implements *pipe flow* calculations (compare to load flow for electrical grids)
  - static or quasi-static analysis of balanced fluid systems
  - computation of temperature, pressure and velocity distributions in pipe networks
- implements *plug flow* calculations (with non-linear pressure drop relation)
  - analysis of thermo-hydraulic transients in fluid systems
  - flow reversals & time-delayed propagation of fluid properties in the pipe system

# Comparison of Modeling Approaches (2/2)



*pandapipes*



*DisHeatLib*

```
# Copyright (c) 2021 by ERIGrid 2.0. All rights reserved.
# Use of this source code is governed by a BSD-style license that can be found in the LICENSE file.

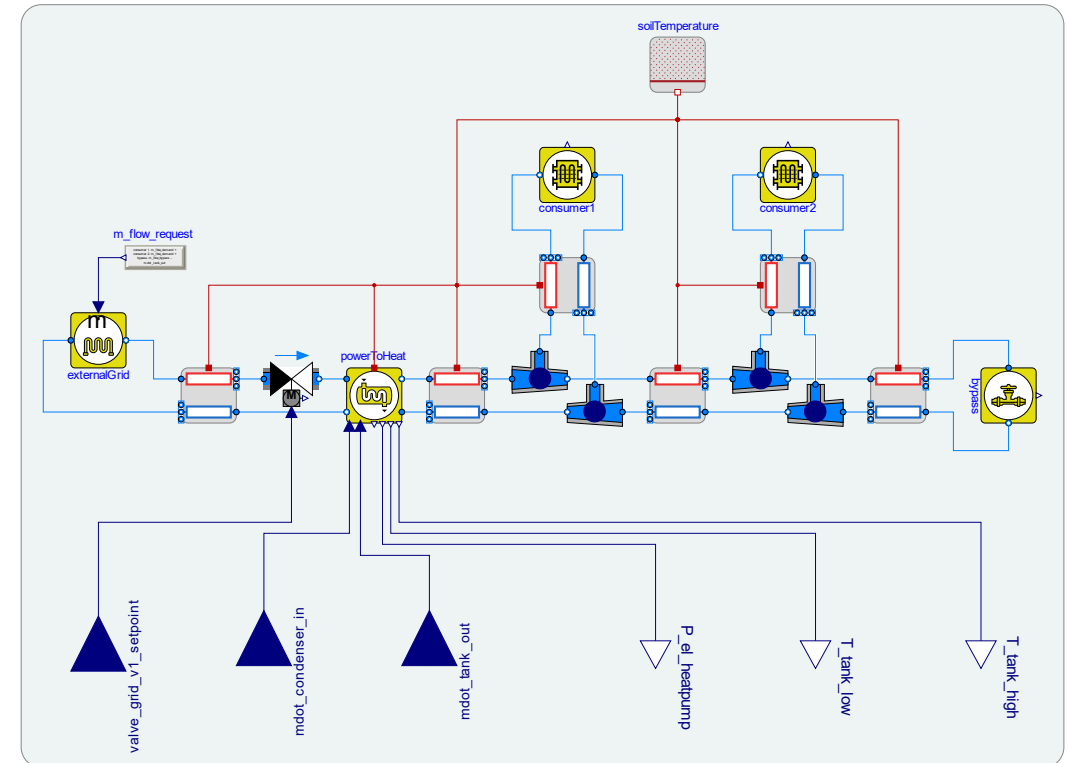
import sys
import math
from dataclasses import dataclass, field
from typing import Dict
import pandas as pd
import numpy as np
import pandapipes as pp
import pandapipes.control.run_control as run_control
from .valve_control import CtrlValve
# import matplotlib.pyplot as plt
# import pandapipes.plotting as plot

if not sys.warnoptions:
    import warnings

# Global
# OUTPUT_PLOTTING_PERIOD = 60 * 60 * 4 - 60

@dataclass
class DHNetwork:
    """
    Pandapipes district heating network model.
    """

    # Parameters
    T_amb: float = 8 # Ambient ground temperature [degC]
    enable_logging: bool = True # enable power flow logging
    T_supply_grid: float = 75 # Supply temperature of the external grid [degC]
    P_grid_bar: float = 6 # Pressure of the external grid [bar]
    P_hp_bar: float = 6 # Pressure of the heat pump + storage unit [bar]
    tank_installed: bool = True # Enable hp + tank connection point
    # enable power flow logging: bool = True # Enable external temperature flow via heat network interface
```



# Comparison of Tool Coupling Capabilities



*pandapipes*



*DisHeatLib*

- so-called “controllers” implement the coupling points
  - read values from one network
  - apply efficiency factors and unit conversions
  - write the results to another network
- for more advanced use cases, pandapipes’ API can be used for tool coupling in Python
- models can be exported as standalone executable models according to the Functional Mock-up Interface (FMI) specification
- enables a straightforward coupling with any other FMI-compliant simulation tool

# Comparison of Availability



*pandapipes*

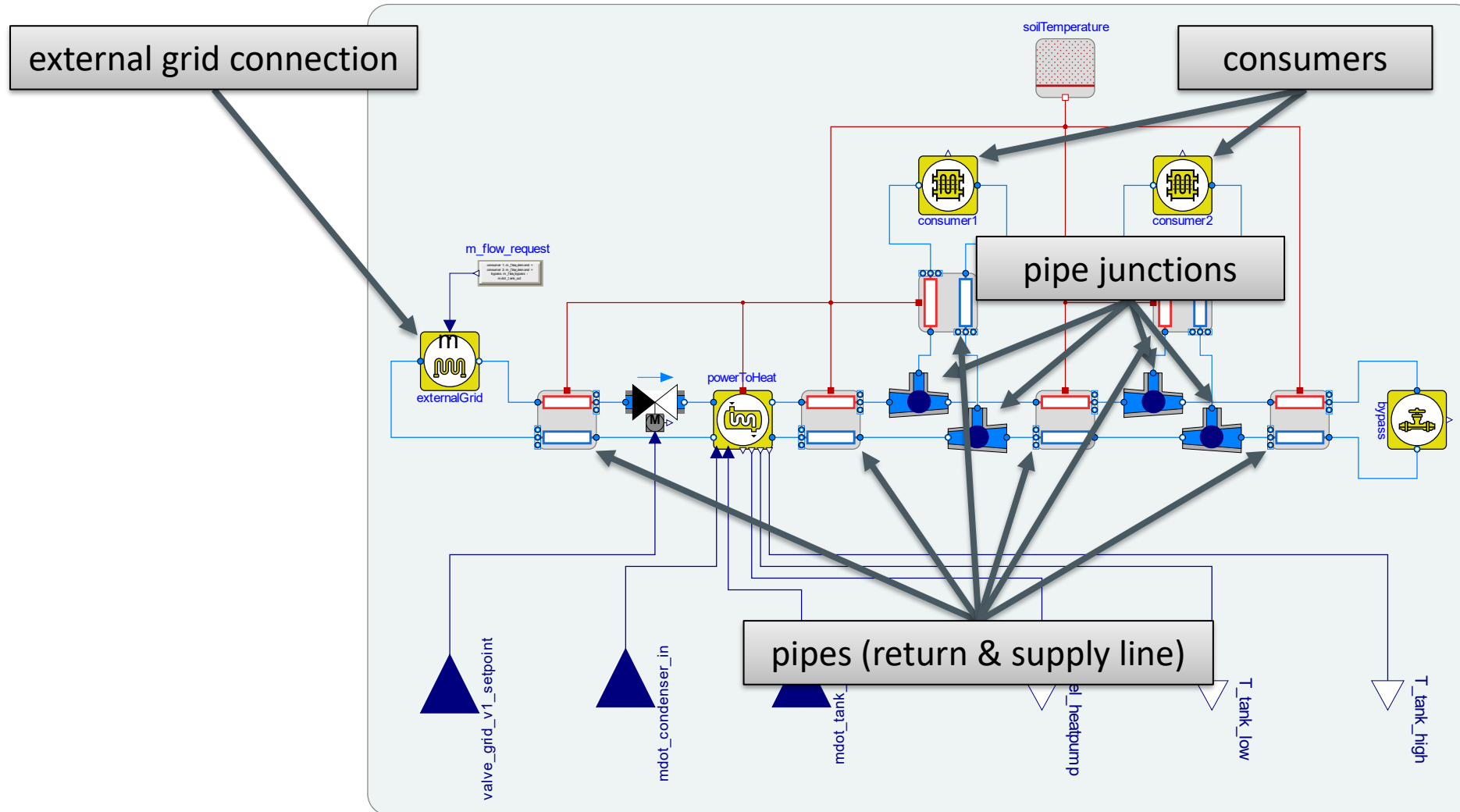
- publicly available open-source Python package
- since Python is also a publicly available open-source tool, pandapipes can be used without a commercial license



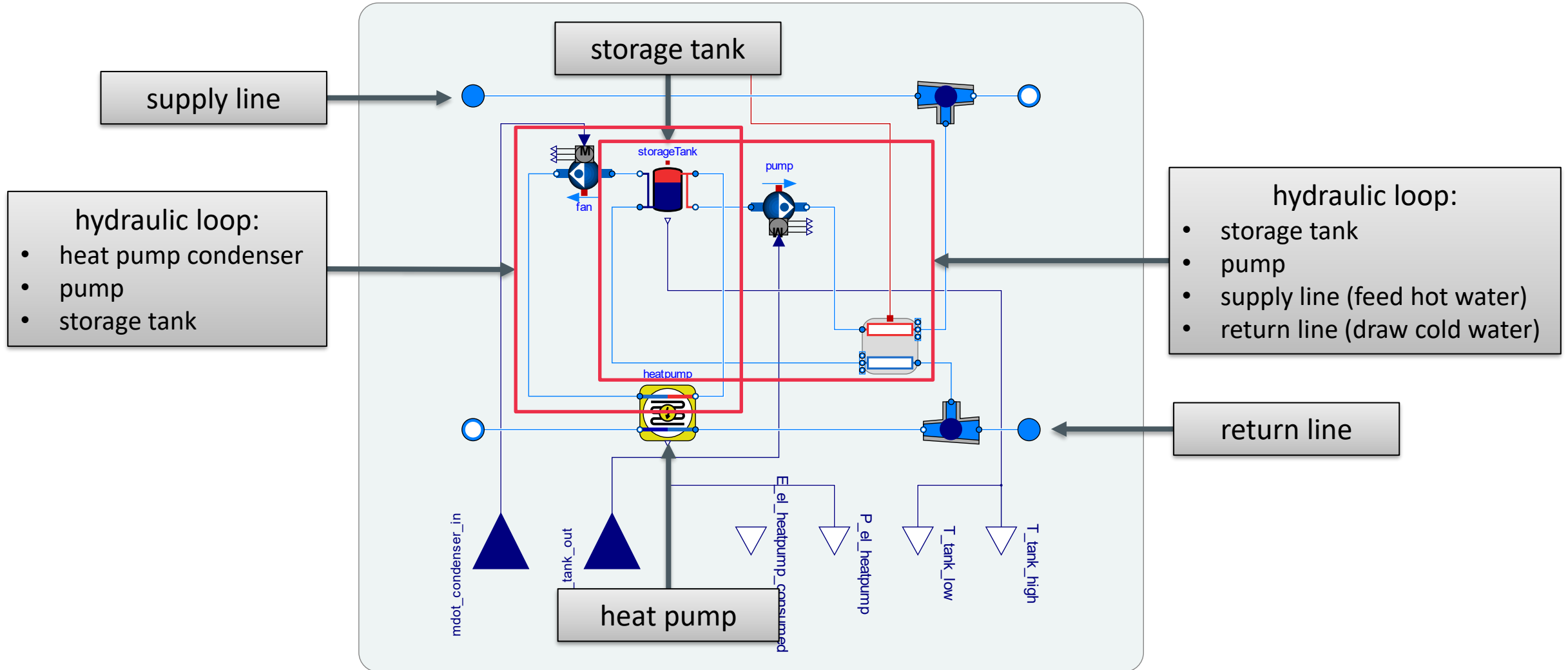
*DisHeatLib*

- publicly available open-source Modelica library
- for compiling models created from the DisHeatLib to an executable, the proprietary Dymola tool is required
- in the future, a complete open-source tool support through OpenModelica is expected

# DisHeatLib: Thermal Network Model

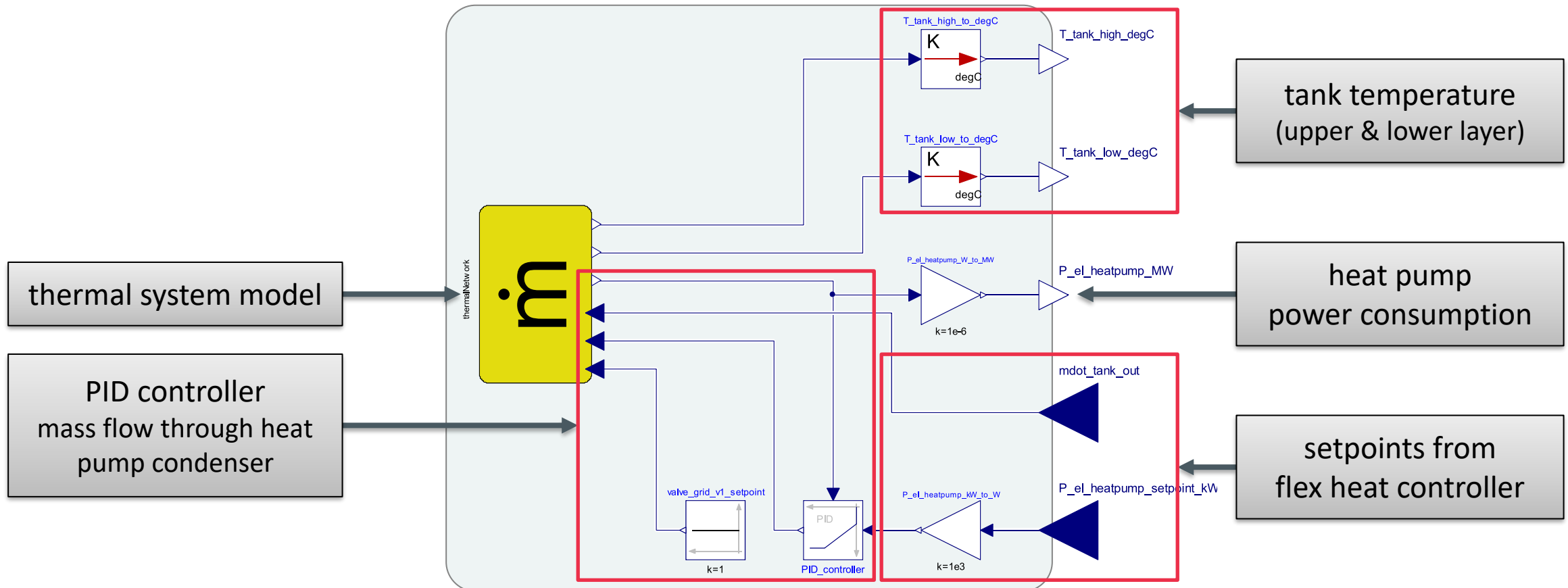


# DisHeatLib: Power-to-Heat Facility Model



# DisHeatLib: Thermal System Model

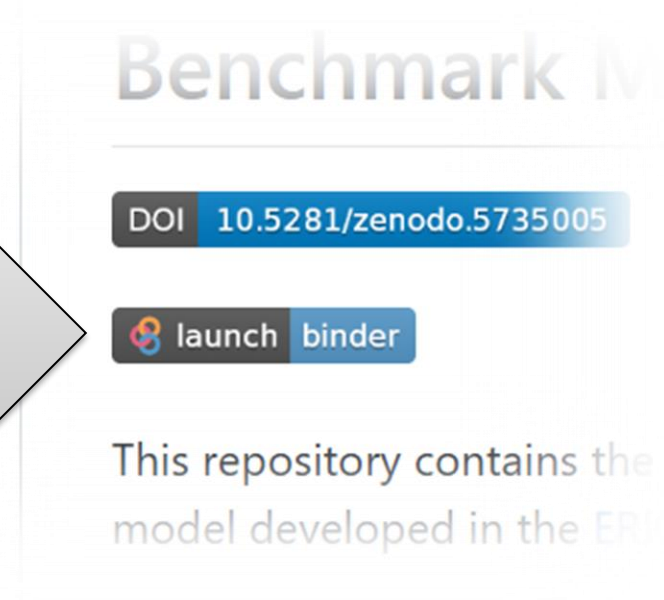
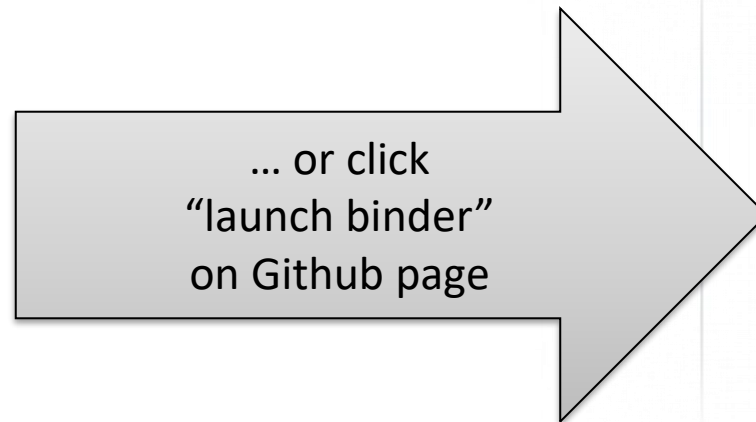
- thermal system model is exported as standalone executable binary (Functional Mock-up Unit, FMU)



# Hands-on Demo

available online via Binder:

<https://mybinder.org/v2/gh/ERIGrid2/benchmark-model-multi-energy-networks/mooc-demo?labpath=Welcome.ipynb>





# Hands-on Demo

Things you can explore when working with the online demo:

- Run the implementation based on pandapipes:
  - compare results with the DisHeatLib implementation
- Take a look at the source code (advanced):
  - How are Python-based simulators (pandapower, pandapipes, controllers) integrated into mosaik?
  - How is the FMU containing the DisHeatLib model integrated into mosaik?

# Conclusion

- co-simulation is a powerful approach for the assessment of multi-domain energy systems
- the mosaik framework provides a versatile environment for co-simulation
- ERIGrid 2.0's multi-energy network benchmark provides a typical use case for using co-simulation
  - couple multiple domains: power, heat, control
  - connect domain-specific simulators
  - combined analysis of all domains in high detail

# Links

- ERIGrid 2.0 multi-energy networks benchmark:  
<https://github.com/ERIGrid2/benchmark-model-multi-energy-networks/tree/mooc-demo>
- ERIGrid 2.0 multi-energy networks benchmark online demo:  
<https://mybinder.org/v2/gh/ERIGrid2/benchmark-model-multi-energy-networks/mooc-demo?labpath=Welcome.ipynb>
- mosaik: <https://mosaik.readthedocs.io/>
- DisHeatLib: <https://github.com/AIT-IES/DisHeatLib>
- pandapipes: <https://pandapipes.readthedocs.io>
- pandapower: <https://pandapower.readthedocs.io>

# Backup: Voltage Controller Implementation

- Python implementation
- straightforward procedural implementation:
  - simple calculations:
    - voltage deviation
    - step function residual
    - power consumption setpoint for heat pump
  - simple logical comparisons:
    - check deadband
    - min/max of power consumption setpoint
    - ramp up/down constraints

```
def step_single(self, time):  
  
    # Increment counter.  
    self.hp_operation_steps += 1  
  
    hp_off = (self.hp_p_el_mw_setpoint == 0)  
  
    if hp_off and (self.hp_operation_steps < self.hp_operation_steps_min):  
        return  
  
    # Calculate voltage deviation.  
    delta_v_meas_pu = self.vmeas_pu - 1  
  
    delta_vm_lower_pu = self.delta_vm_lower_pu_hp_off if hp_off else self.delta_vm_lower_pu_hp_on  
  
    # Check delta_vm_deadband.  
    if delta_vm_lower_pu < delta_v_meas_pu < self.delta_vm_upper_pu:  
        if (self.hp_p_el_mw_setpoint == 0) and (self.hp_operation_steps >= self.hp_operation_steps_min):  
            self.hp_p_el_mw_setpoint = self.hp_p_el_mw_min  
            self.hp_p_el_kw_setpoint = 1e3 * self.hp_p_el_mw_setpoint  
            self.hp_operation_steps = 0 # Turn on HP --> reset counter  
        return  
  
    # Calculate residual.  
    res = self.k_p * (delta_v_meas_pu - self.delta_vm_deadband) / self.hp_p_el_mw_step  
    step_res = int(res)  
  
    # Use step functions to adapt HP setpoint.  
    if fabs(res - step_res) > self.hp_p_el_mw_step:  
        self.hp_p_el_mw_setpoint += self.hp_p_el_mw_step * (step_res + 1)  
  
    # Check min and max for HP setpoint.  
    if (self.hp_p_el_mw_setpoint > self.hp_p_el_mw_rated):  
        self.hp_p_el_mw_setpoint = self.hp_p_el_mw_rated  
    elif (self.hp_p_el_mw_setpoint < self.hp_p_el_mw_min) and (self.hp_operation_steps >= self.hp_operation_steps_min):  
        self.hp_p_el_mw_setpoint = 0  
        self.hp_operation_steps = 0 # Turn off HP --> reset counter  
    elif (self.hp_p_el_mw_setpoint < self.hp_p_el_mw_min) and (self.hp_operation_steps < self.hp_operation_steps_min):  
        self.hp_p_el_mw_setpoint = self.hp_p_el_mw_min  
  
    self.hp_p_el_kw_setpoint = 1e3 * self.hp_p_el_mw_setpoint
```