

# Hybrid energy systems

Innovate 2022

Day 2 – October 20<sup>th</sup> , Stockholm



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At Modelon since 2009

PhD in Controls from Lund University, Sweden (2005)

M. Sc. E.E, Grenoble Institute of Technology, France (1999)

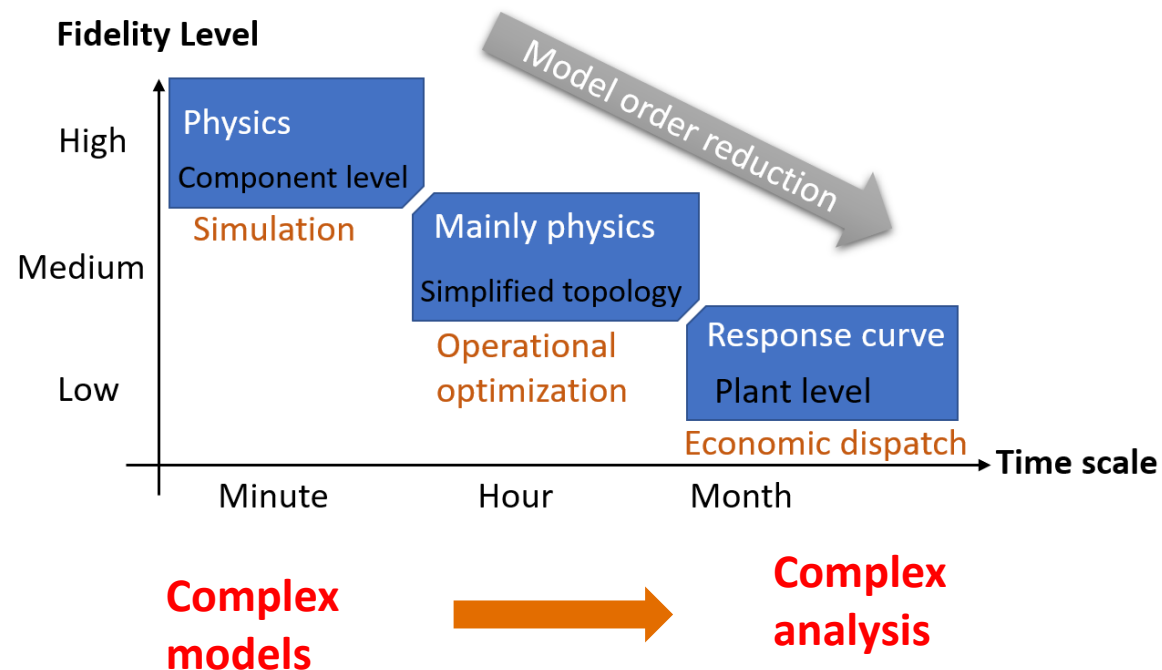
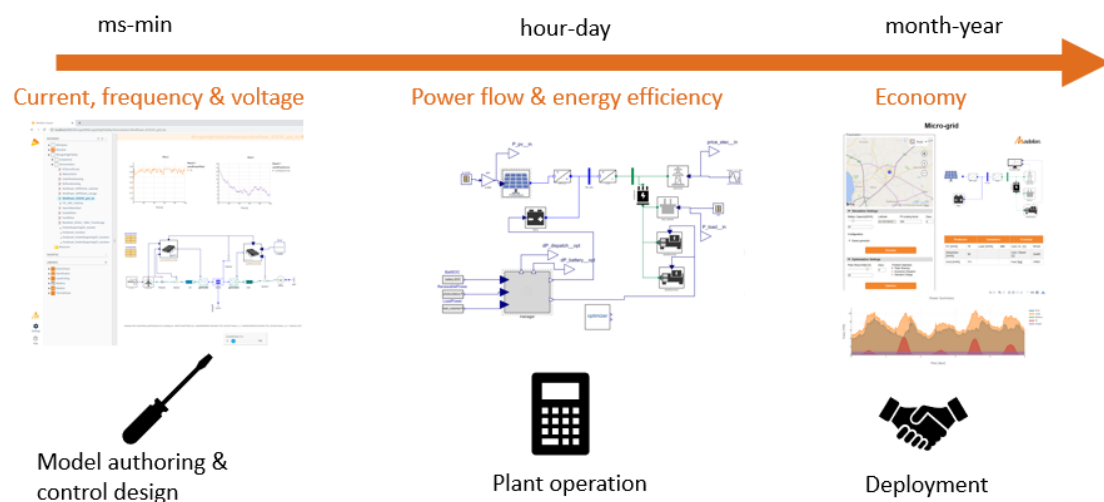


# Why hybrid energy systems ?

- Energy transition: large variety of technologies
  - Conventional power plants
  - Renewable energy sources
  - Energy Storage Systems
- Sector coupling: Power-to- (gas, heat, power, X), EV to grid
- Hybrid & complex systems to design, control and integrate
- System simulations can support innovation

# FIT FOR PURPOSE MODELLING

Acknowledge the need for models of various fidelity levels



# Outline

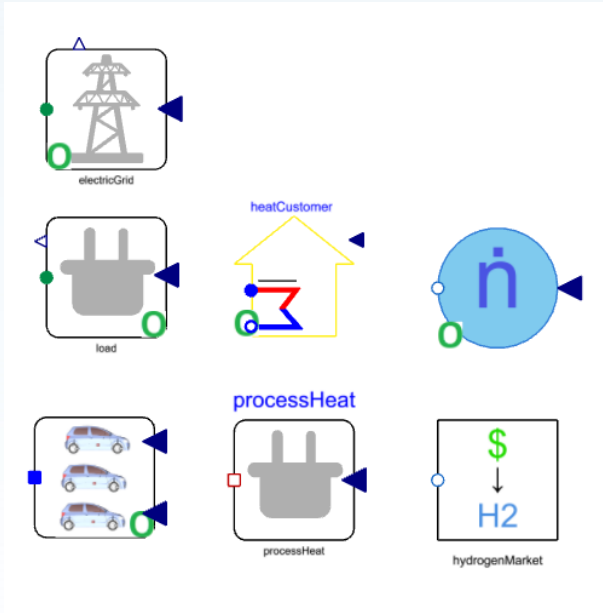
- Techno-economic assessment of hybrid energy projects
- Integration of renewable energy sources & storage
- Power to heat – heat pump integration

# Techno-economic assessment of hybrid energy projects

- Microgrid package
- Optimization workflow
- Sizing and operation of storage
- Complex hybrid energy systems

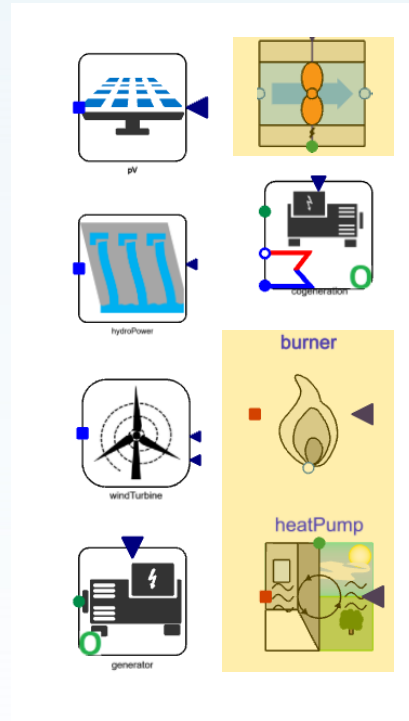


# Microgrid package at a glance



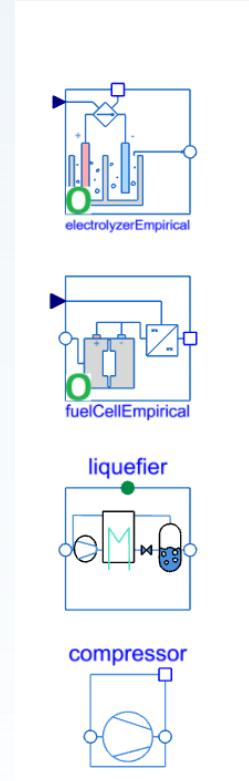
## Sources and sinks

Power, heat or hydrogen



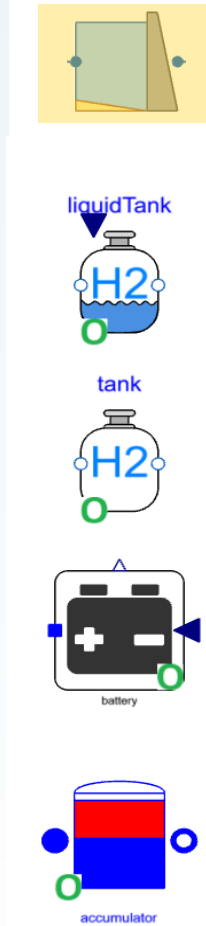
## Production & conversion

Power & heat



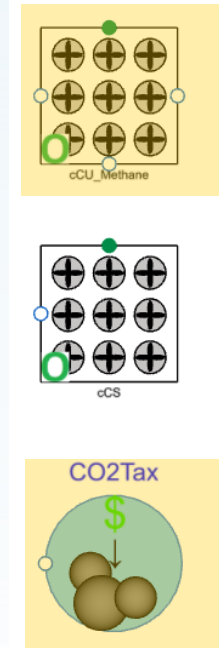
## Production & conversion

Hydrogen



## Storage

Power, heat or hydrogen



## Carbon capture & utilization

2022.2

2023.1



# Updates since 2022.1

## Library scope

- Carbon capture
- Liquid tank H2
- Liquefier
- Gas market
- Electrolyzer and fuel cell with constant efficiency

## Workflow

- Unique model for
  - Initial simulation
  - Optimization
- Automatic summation of costs
- Excel file import for forecast (load, prices, renewable power)

## Performance

- Full year optimization with 1h sampling in 3-15 min

# Physical modelling

- Efficiency-based
  - Constant
  - Load dependent
- Static components – except for storage!
- Simpler media models
  - Constant properties
  - Heating value, density, heat capacity, carbon content,...
- Nonlinearities from loss, compression, efficiency map, enthalpy flow

## Electrolyzer

$$V_{cell,el} = E_{rev} + (r_1 + r_2 T_{el}) i_{el} + s \log_{10} \left( (t_1 + t_2 T_{el} + t_3 T_{el}^2) i_{el} + 1 \right)$$

$$\dot{n}_{H_2,el} = \eta_F \frac{n_{el} i_{el} A_{el}}{zF}$$

$$\eta_F = \frac{i_{el}^2}{f_1 + i_{el}^2} f_2$$

## Battery


$$C \frac{dSOC}{dt} = P \cdot \begin{cases} \eta & \text{if } P > 0 \\ \frac{1}{\eta} & \text{if } P < 0 \end{cases}$$

## Compressor

$$P = \dot{m} \frac{RT}{M} \log\left(\frac{p_{in}}{p_{out}}\right)$$

# Optimization components

## Optimizer for cost & solver settings



optimizer  
Definition of the optimization cost function  
ThermalPower.MicroGrid.Optimization.Optimizer

INFORMATION

This block defines dynamic optimization problems in continuous time:  
$$\min_{u(t), p} cost = \int_0^{T_{optimization}} L(x, u, p) dt$$

where  $L(x, u, p)$  is the integral cost depending on the controls  $u$ , the process state  $x$ , and the plant parameters  $p$ . The cost integrand can be typically written as the sum of two terms

$$L(x, u, p) = cost_y + cost_u$$

PROPERTIES

General

Solver options

Variables

Parameters

Cost integrand

T\_optimization

costIntegrand\_y

costIntegrand\_u

exclude\_integrators

600

$((\text{tank2.level}-2))^2$

0

☒ »

Collocation

n\_cl

n\_cp

n\_bl

quad\_pen

1

1

1

1

IPOPT

max\_iter

tol

use\_ma57

2500

1e-6

☒ »

## Inequality constraint block



constraint\_  
Block for time-invariant inequality constraints in the optimization  
ThermalPower.MicroGrid.Optimization.Constraint

INFORMATION

This block defines time-invariant inequality constraints for the input variable "expr". The inequality is to be satisfied at all time points in the optimization interval:  
$$min_{val} < exp(t) < max_{val}, \quad \text{for all } t$$

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PROPERTIES

Expression

exp

Constraining values

tank.level

min\_val

max\_val

0.01

1

Any variable bound is interpreted as optimization constraint

General

Variables

u\_opt

start

min

max

1

0

30

☐ »

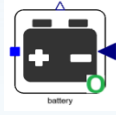
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# Economy modelling

2022.2

- CapEx and OpEx added to all components
  - Economy Tab
  - CapEx assumed to scale linearly with component capacity
  - Fixed or varying operational costs
- Automatic summation of all costs in *Economy* component
  - Cost normalized by life-time – to be included as integrand term in optimization
  - Capex\_per\_second, opex\_per\_second
- Allows technology assessment *w.r.t.* various KPIs
  - CapEx, OpEx, Total Cost of Ownership, Net Present Value, pay-back time




PROPERTIES			
General	Optimization	Economy	Variables
lifetime	:	10	yr
capex_p	:	0	1/kW
capex_e	:	150	1/(kW-h)
fixed_opex_p	:	0	1/(kW-yr)
fixed_opex_e	:	0	1/(kW-h-yr)



economy.

- capex
- capex\_per\_second
- > economyConnector
- fixed\_opex
- fixed\_opex\_per\_second



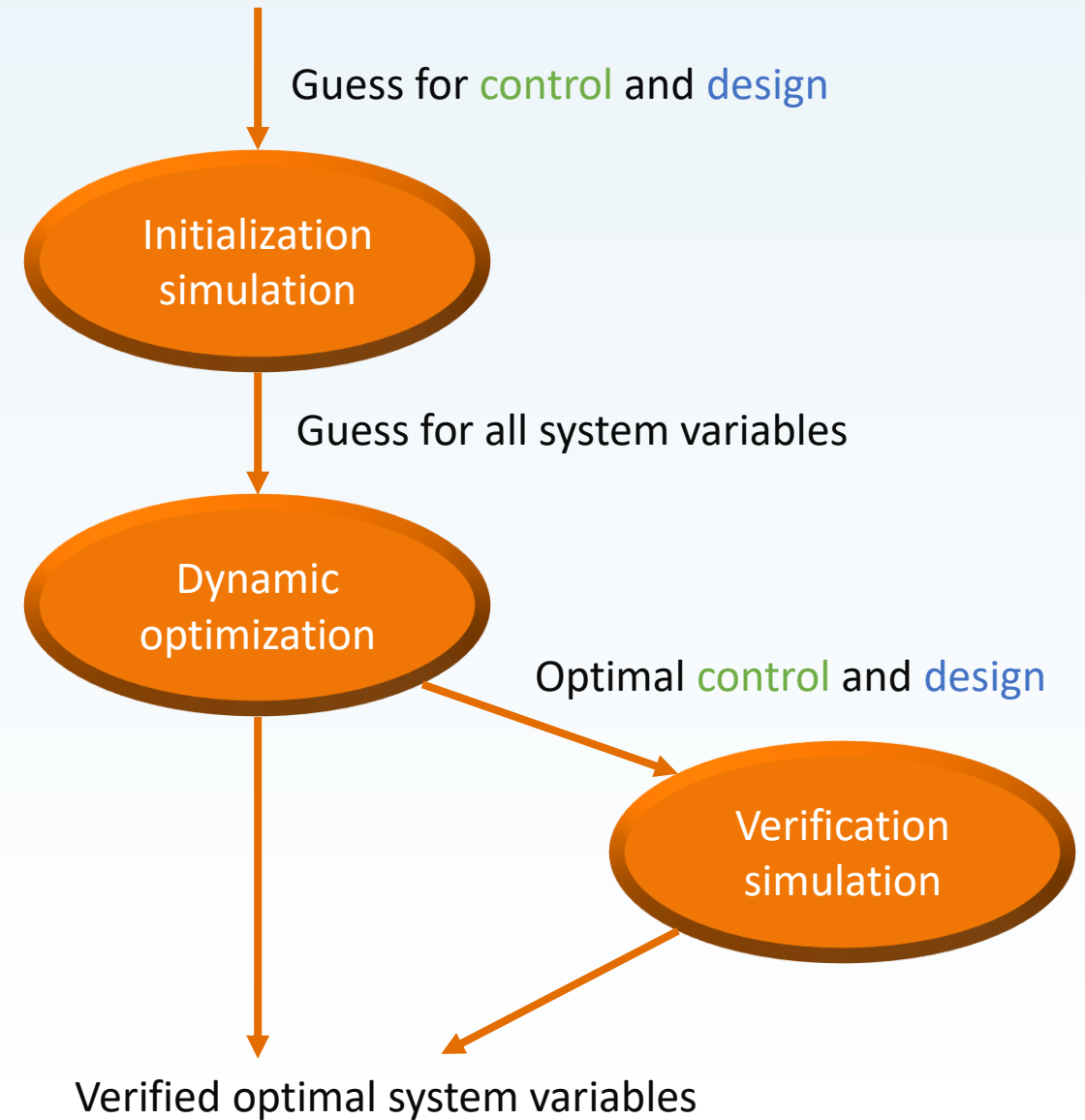
General	Solver options	Variables
Parameters		
T_optimization	:	60*3600*24
Cost integrand		
costIntegrand_y	:	economy.capex_per_second+economy.op
costIntegrand_u	:	0
exclude_integrators	:	<input type="checkbox"/> »

# Techno-economic assessment

- Microgrid package
- Optimization workflow
- Sizing and operation of storage
- Complex hybrid energy systems

# Optimization workflow

- Optimization solver needs reasonable initial guess of solution for reliable convergence
- Generated by specifying degrees of freedom
  - Component sizes
  - Control laws

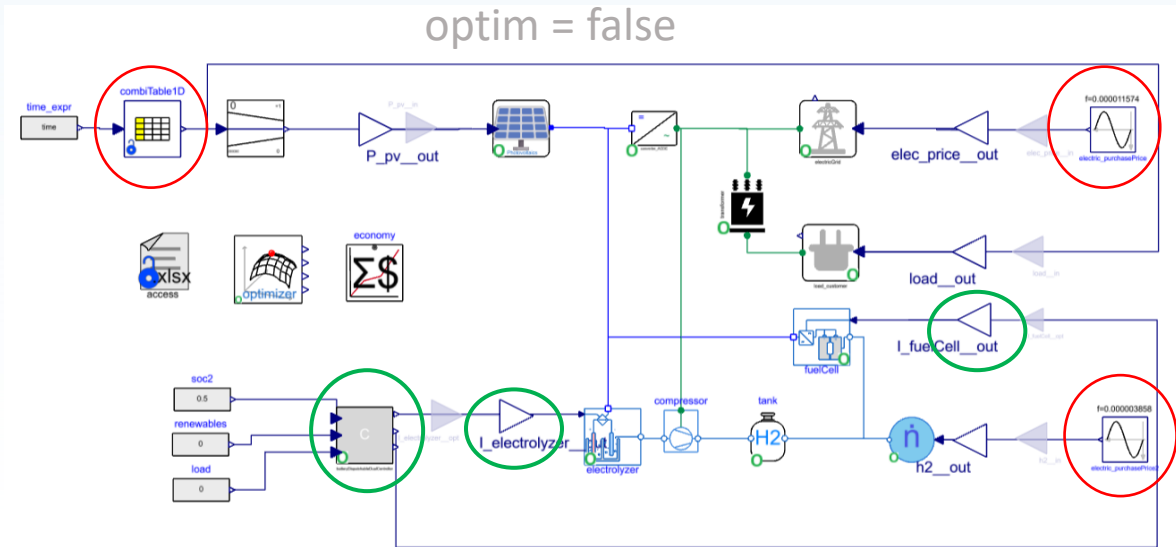


# Initialization versus optimization models

## Simulation model

**Boundary conditions** assigned by blocks

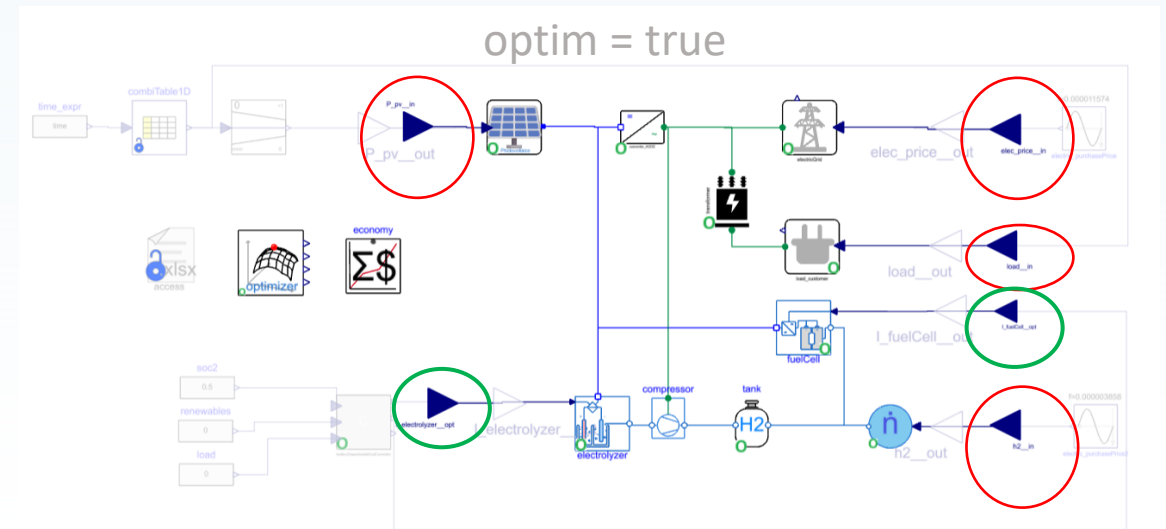
**Controller** for electrolyzer & fuel cell



## Optimization model

**Boundary conditions** set by inputs

**Control signals** set by inputs



# Custom function

- Custom function runs the entire optimization workflow and returns the results
- Found in the Resources folder of Thermal Power Library
- To be placed
  - Local install: C:\Users\UserName\impact\custom\_functions
  - Server install: /home/jovyan/impact/custom\_functions
- All settings read from optimizer block

Import methods for compilation and fmu loading

```
from pymodelica import compile_fmu
from pyfmi import load_fmu
from pyjmi import transfer_optimization_problem
```

Compilation & loading of the model for initialization

```
# Compile the optimization initialization model
init_sim_fmu = compile_fmu("CSTR.CSTR_Init_Optimization", "CSTR.mop")

# Load the model
init_sim_model = load_fmu(init_sim_fmu)
```

Initial simulation

```
# Simulate with constant input Tc
init_res = init_sim_model.simulate(start_time=0., final_time=150.)
```

Compilation of the optimica code

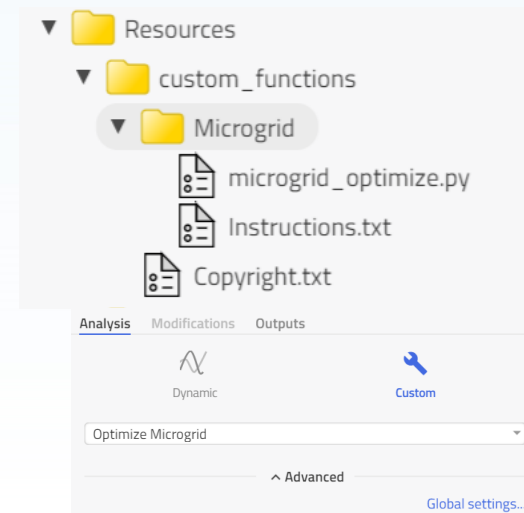
```
# Compile and load optimization problem
op = transfer_optimization_problem("CSTR.CSTR_Opt2", "CSTR.mop")
```

Optimization options

```
# Set options
opt_opts = op.optimize_options()
opt_opts['n_e'] = 19 # Number of elements
opt_opts['init_traj'] = init_res
opt_opts['nominal_traj'] = init_res
opt_opts['IPOPT_options']['tol'] = 1e-10
```

Optimization

```
# Solve the optimal control problem
res = op.optimize(options=opt_opts)
```





# Techno-economic assessment

- Microgrid package
- Optimization workflow
- Sizing and operation of storage

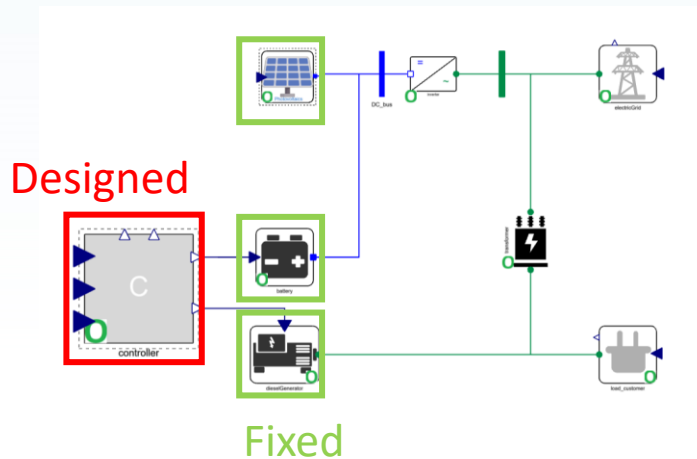
# Storage – design, operation and integration

- Storage to mitigate impact of variability and uncertainty of renewables
  - Decoupling of demand & production
  - Sector decoupling
- Significant research to develop new storage systems
  - Cheap, scalable (capacity & power), dispatchable, efficient, sustainable
  - Electrical, thermal, thermal electrical, potential, chemical
- Investors & innovators need a tool for early assessment

# Typical approach – Sizing and controls done separately

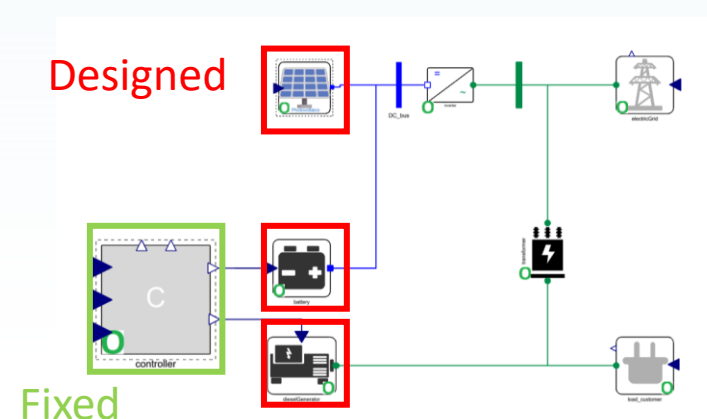
## Control

- When designing a control strategy, the assets' size is normally considered fixed
- Control aims at operating the assets for a minimal operational cost while fulfilling operational constraints – not easy!
- Focus is on OPEX
- Mathematically, it is about optimization of time-trajectories
  - Ex: battery charging rate



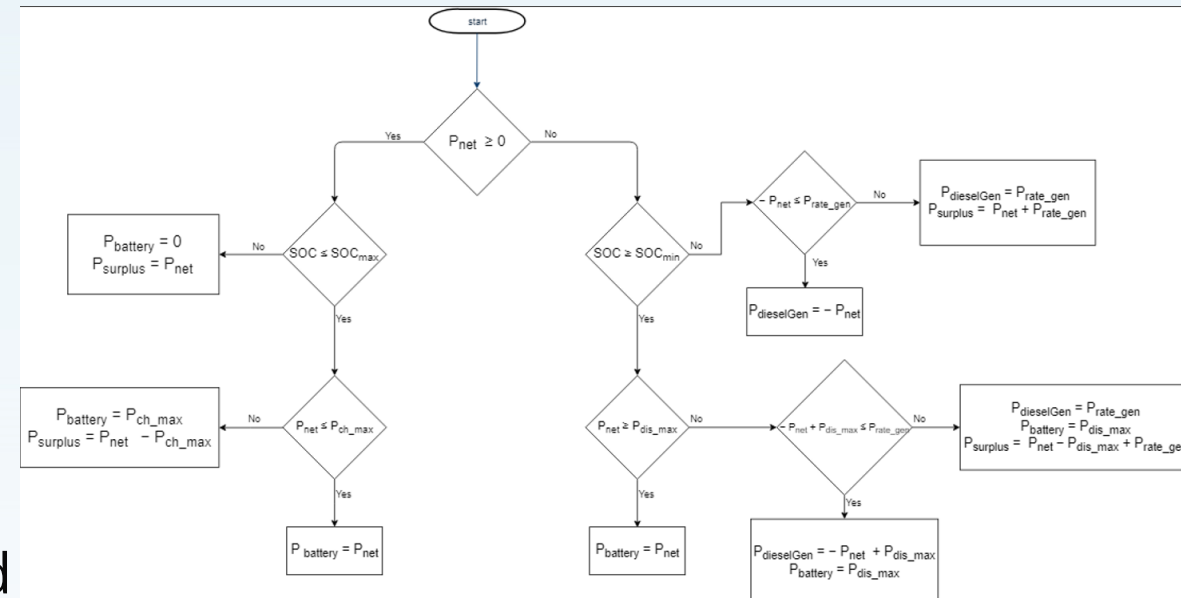
## Sizing

- When sizing, the control strategy is normally fixed
- Sizing aims at finding the size of all assets for a minimal overall cost while fulfilling operational constraints
- Focus is on CAPEX
- Mathematically, it is about parameter optimization
  - Ex: battery capacity



# Simple storage control

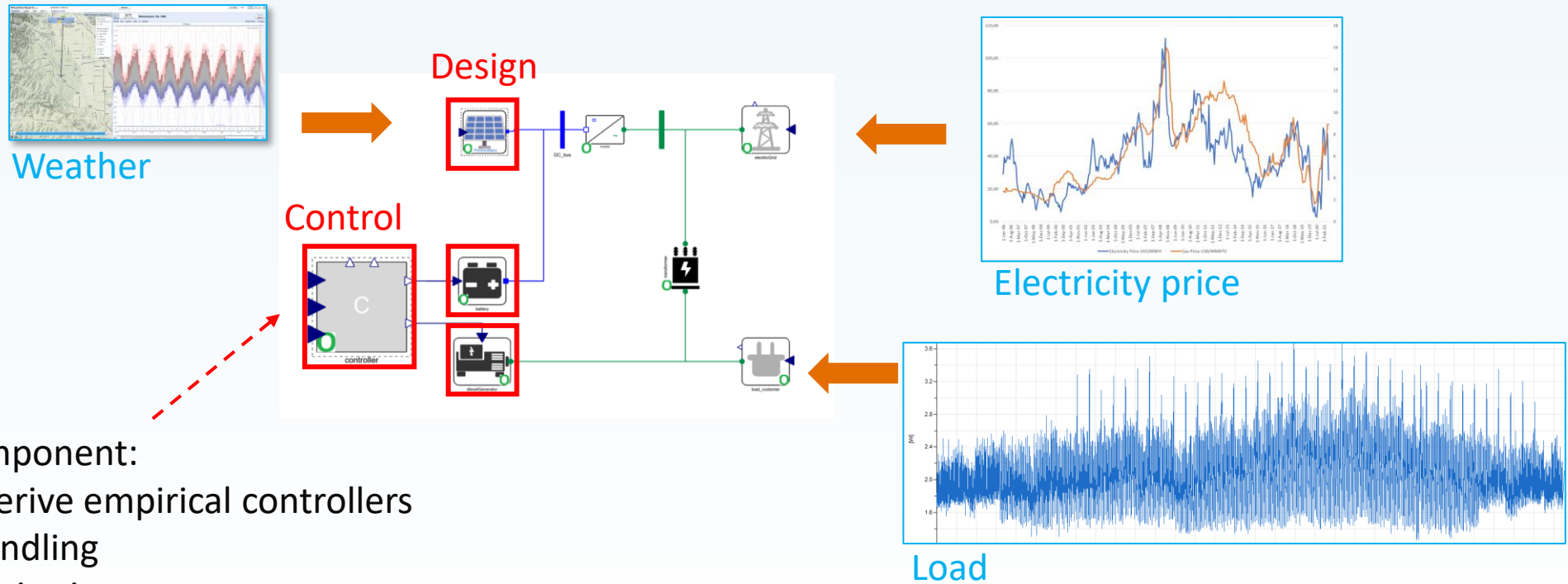
- Simple approach
  - If energy surplus => battery is charged
  - If energy missing => battery is discharged



- No usage of forecast for price, load and weather
- Best control strategy depends on system configuration & boundary conditions
- Difficult to systematically derive control strategy for every considered system

# Proposed approach: Control co-design

Solve simultaneously for optimal control and optimal sizing while exploiting forecast

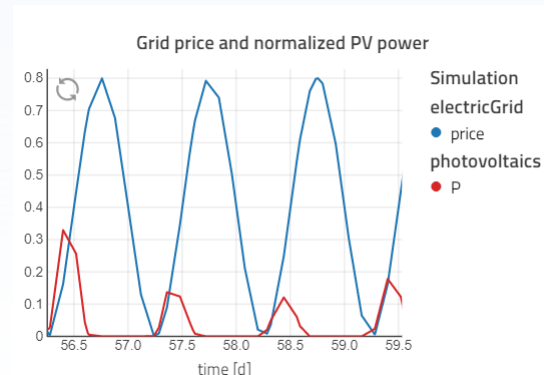
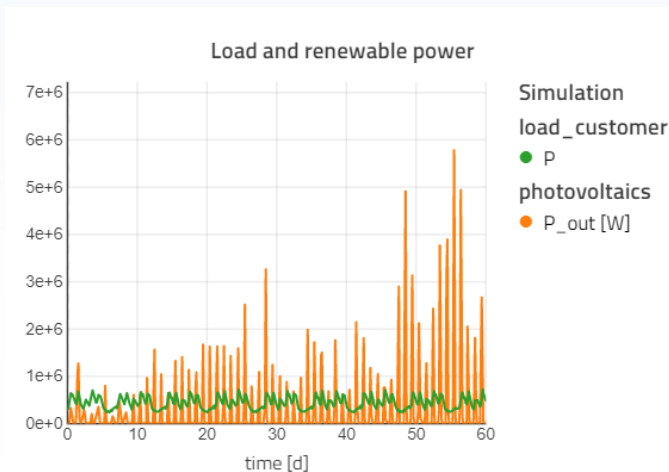


Most critical component:

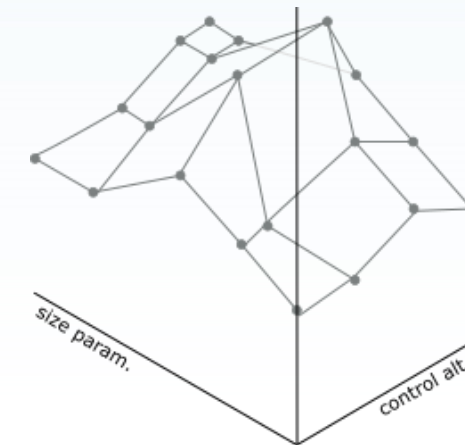
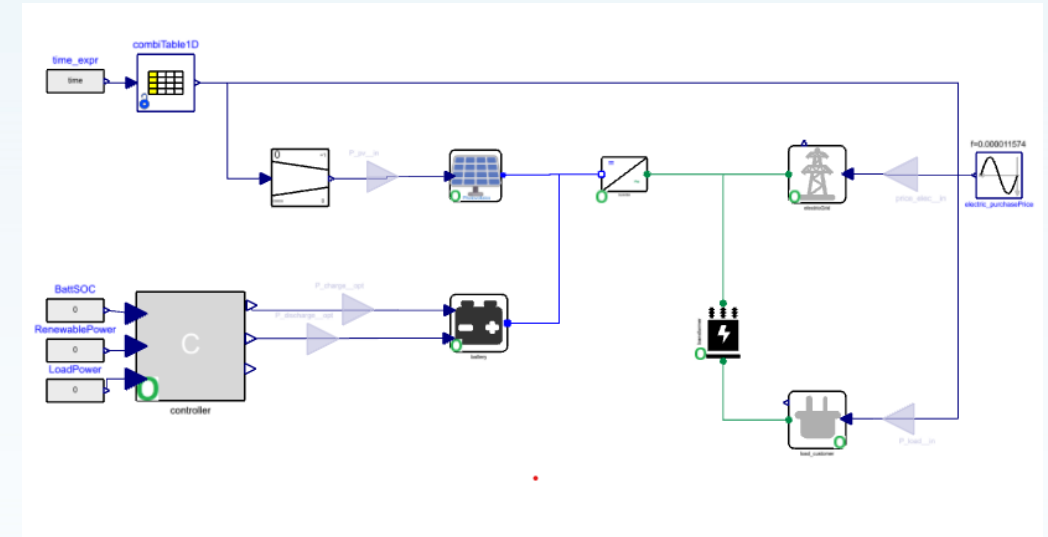
- No need to derive empirical controllers
- Constraint handling
- Forecast exploitation
- Interacting control loops

# Battery sizing – Problem Description

- Given expected profiles over 3 months for
  - Electricity price
  - Load
  - Renewable power
- Find the battery size & operation
- To minimize the total cost of ownership (opex+capex)

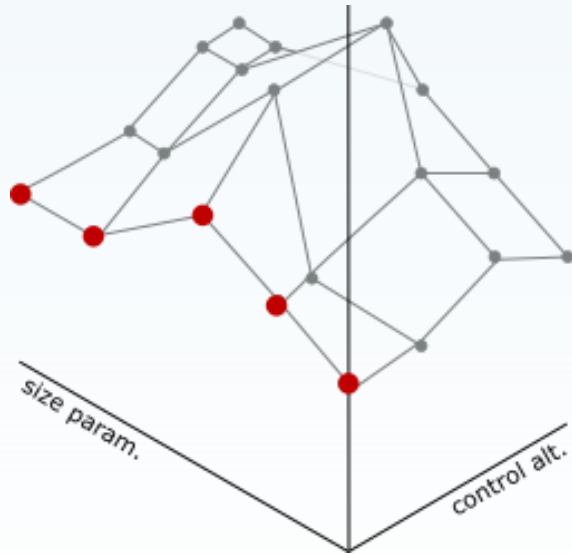


Grid price does not peak at the same time as PV power



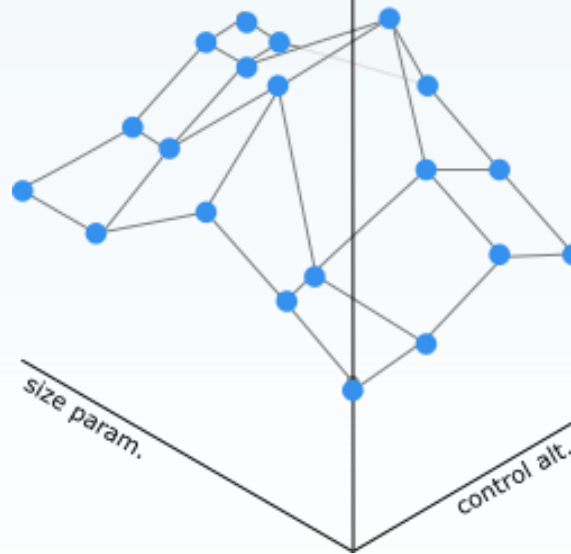
# Evaluation of three strategies

Fixed controller + capacity sweep



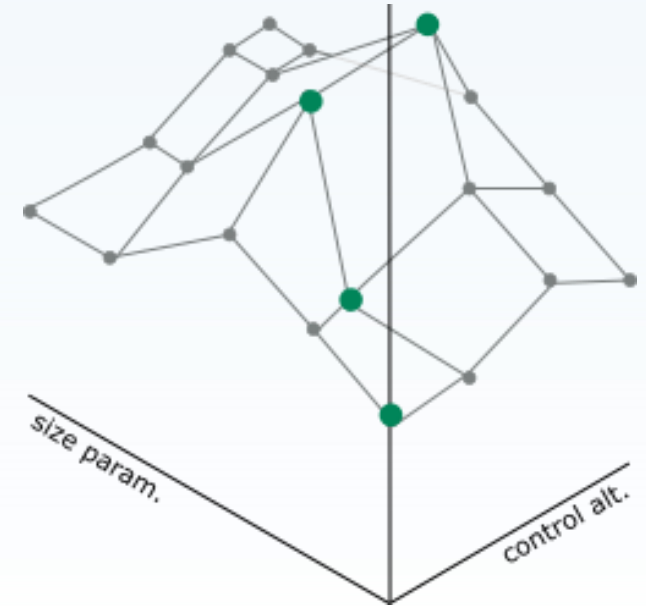
Batch of simulations

Optimal dispatch + capacity sweep



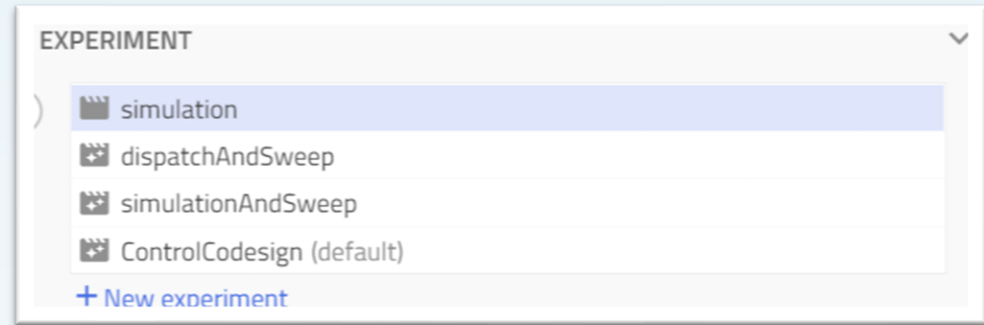
Batch of optimizations

Control co-design

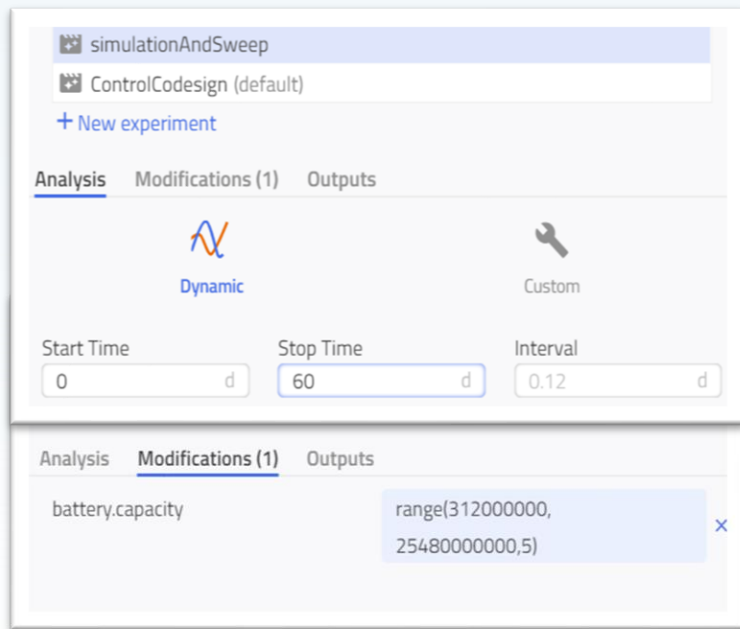


Single optimization

# Experiments in Modelon Impact

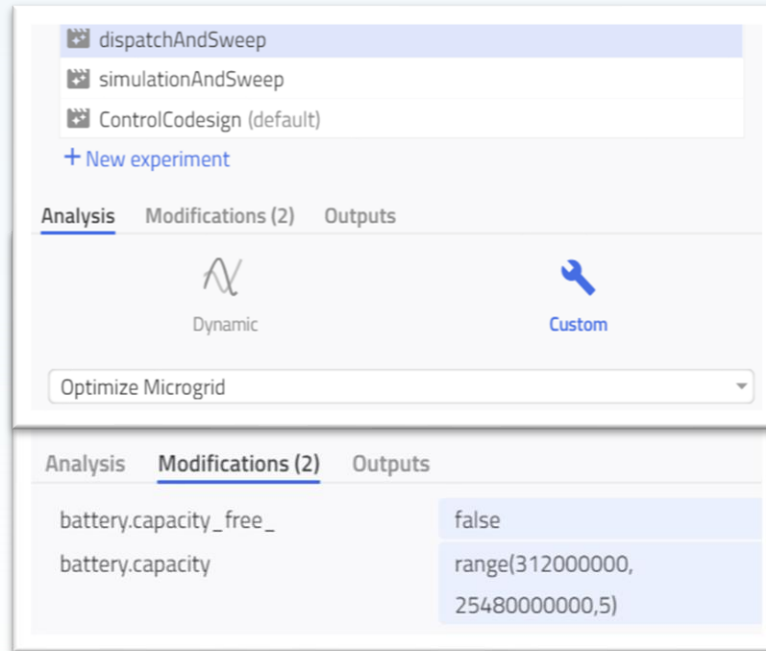


Fixed controller + capacity sweep



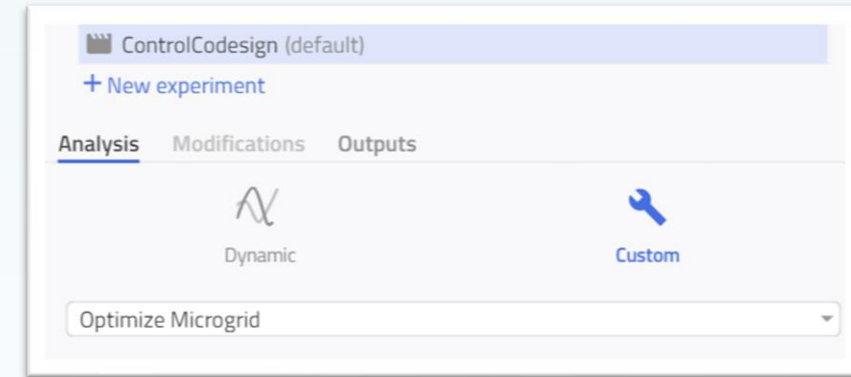
Batch of simulations

Optimal dispatch + capacity sweep



Batch of optimizations

Control co-design

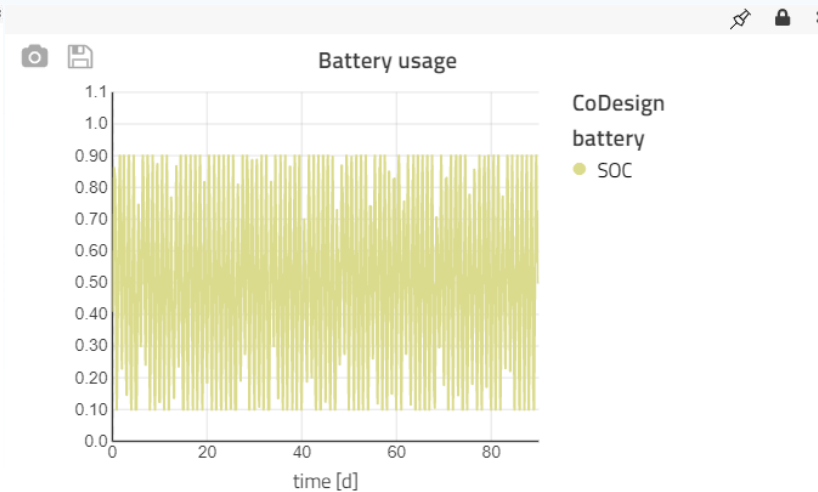
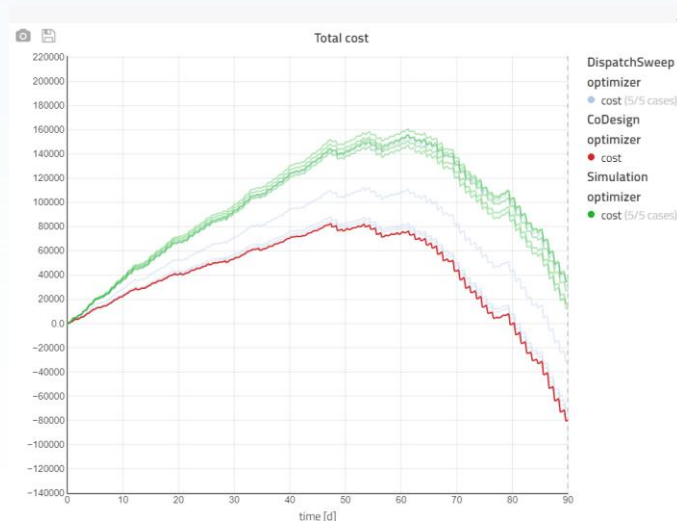


Single optimization

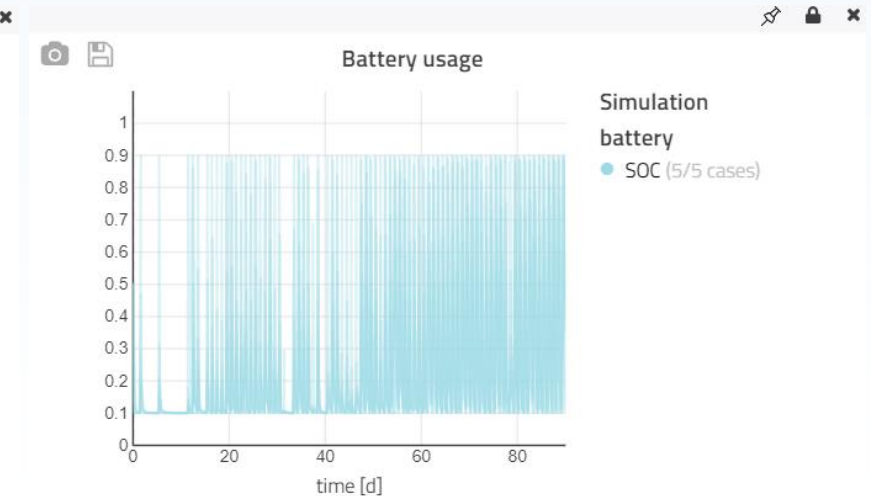


# Results

Strategy	Lowest cost [kEUR]	Optimal storage size [MWh]	Cost at small battery [kWh]	Computation time [s]
Simulation + sweep	12.3 [cost]	2.1 (case 2)	35.5	5s (~5*1)
Optimal dispatch + sweep	-101.3 [benefit]	6.2 (case 4)	32.3	100s (~5*20)
Co-design	-101.4 [benefit]	6.0	-	23s

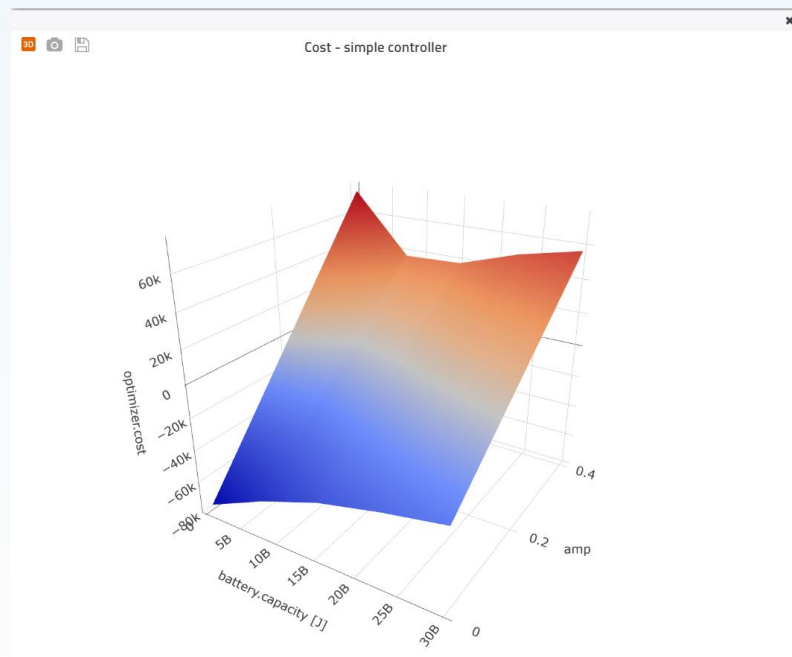


Fully exploited storage

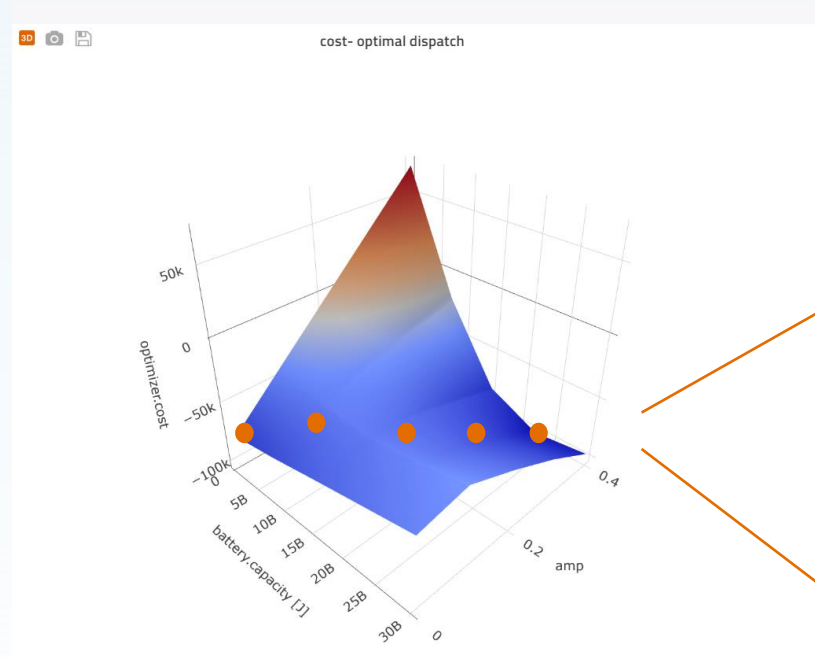


Poorly exploited storage

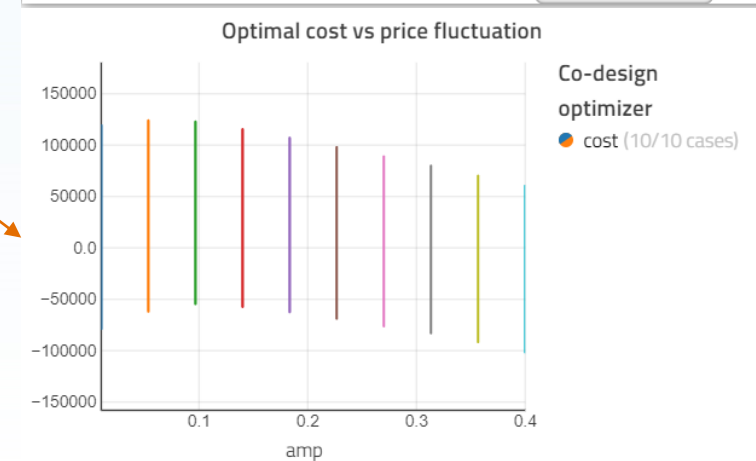
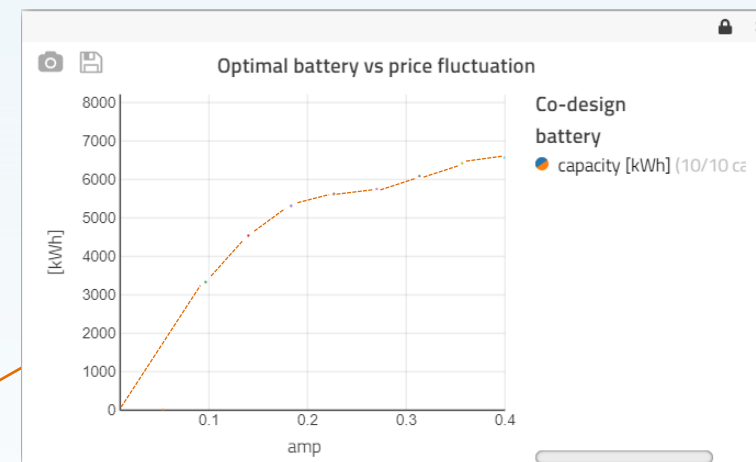
# Sensitivity w.r.t. fluctuations in grid price



Large area in the red (no benefit)  
Optimal storage size at high fluctuations  
No battery best when constant grid price

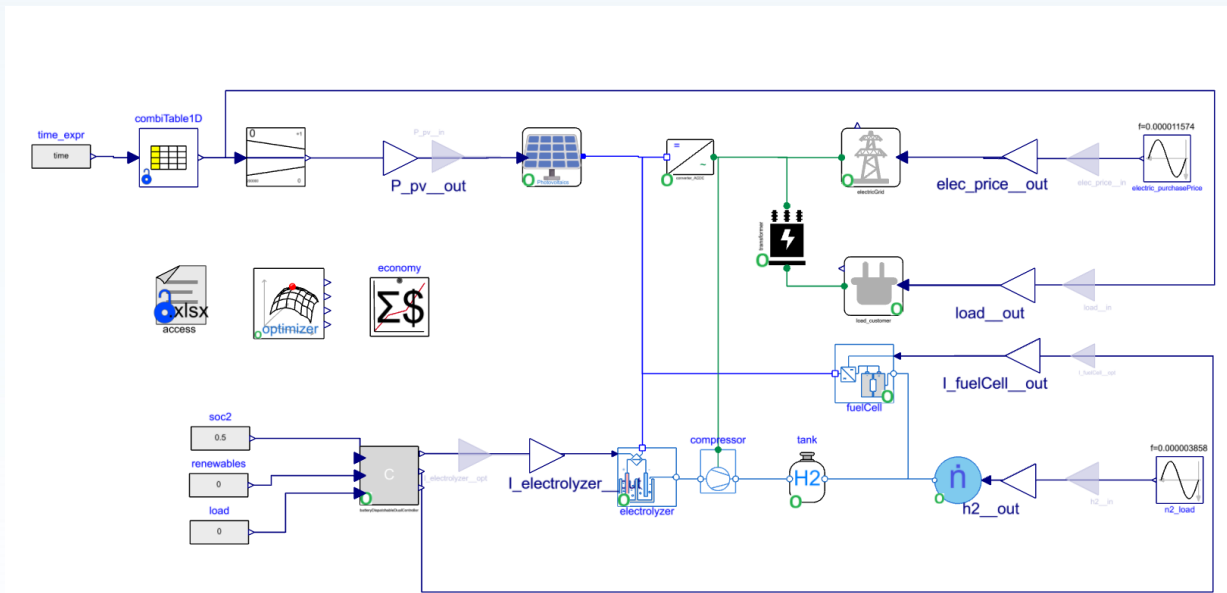


Small area in the red (no benefit)  
Best profit when large battery & fluctuation  
No battery best when constant grid price

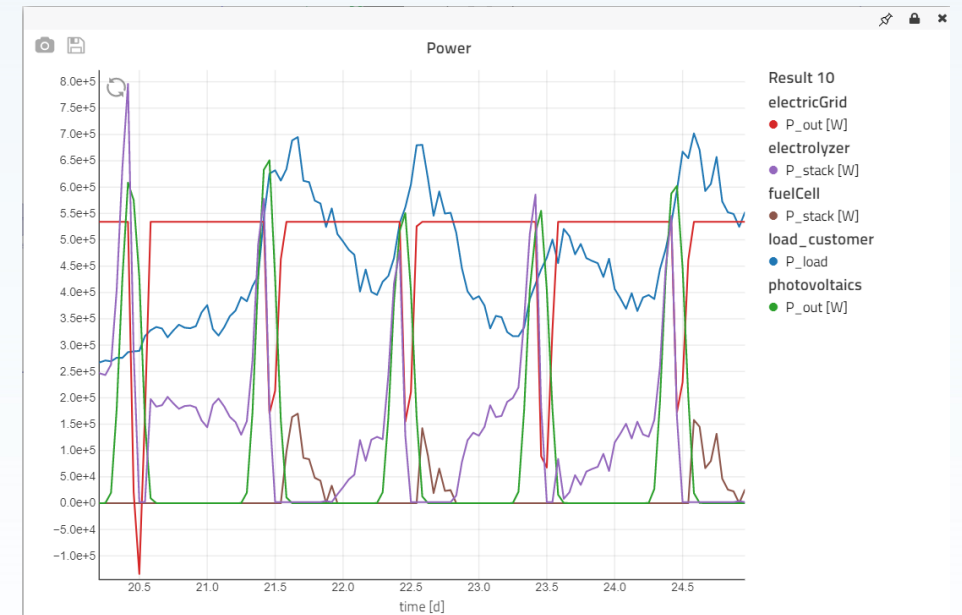


# Optimal operation of a hydrogen system

Minimize the operational cost = demand charge + grid energy



ThermalPower.MicroGrid.Examples.Simulation.EconomicDispatchHydrogen

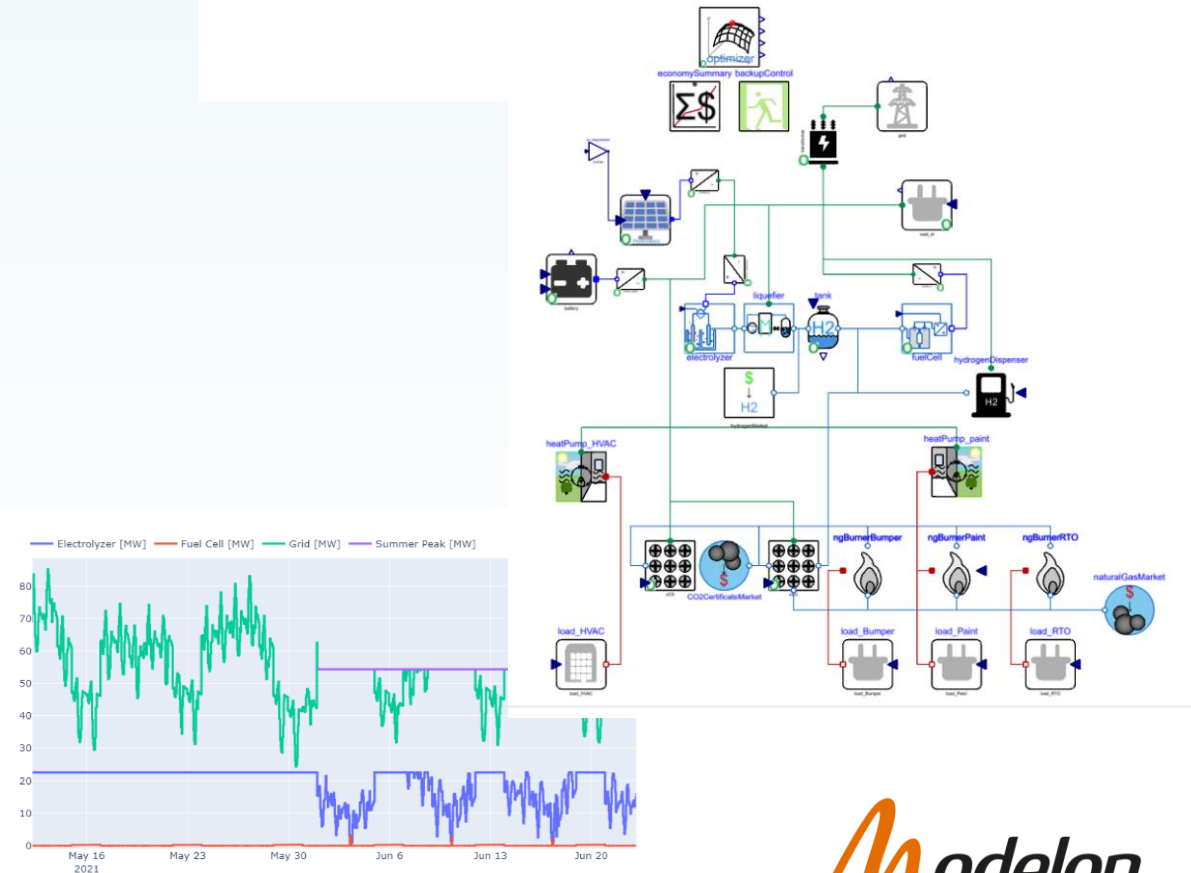
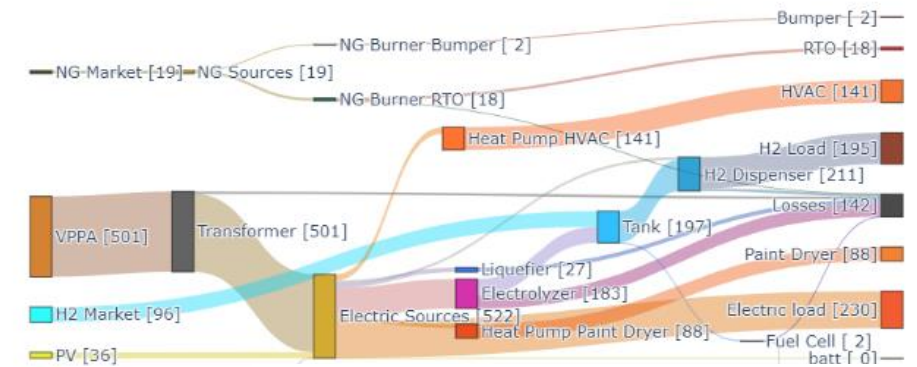


- Grid import shaved to minimize demand charge
- Electrolyzer mainly driven by PV
- Fuel cell used to shave load peaks when no PV output

# Complex energy system

- Car manufacturing company
- Use case to be published at upcoming Asian Modelica conference
- TCO minimization, targeting carbon neutrality
- Technology options
  1. *Import versus on-site generation* for hydrogen and power
  2. *Fuel cell versus battery* for backup-power and peak shaving
  3. *CCS vs. CCUS vs. carbon tax* to deal with the emissions from the combustion processes
  4. *Conventional burner versus heat pump* for drying process

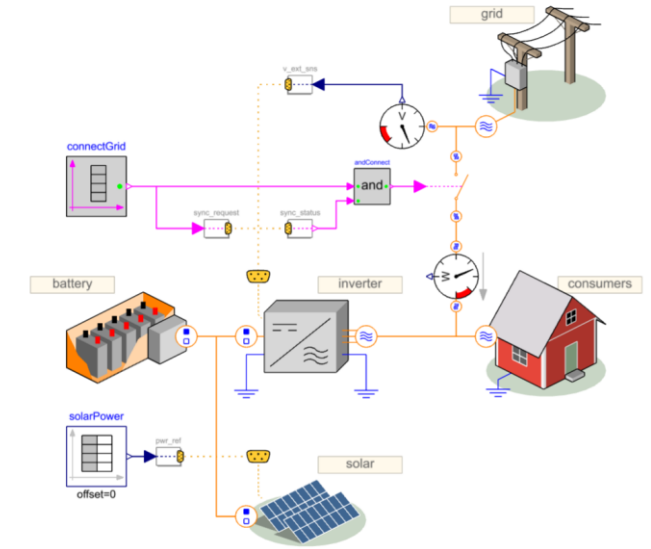
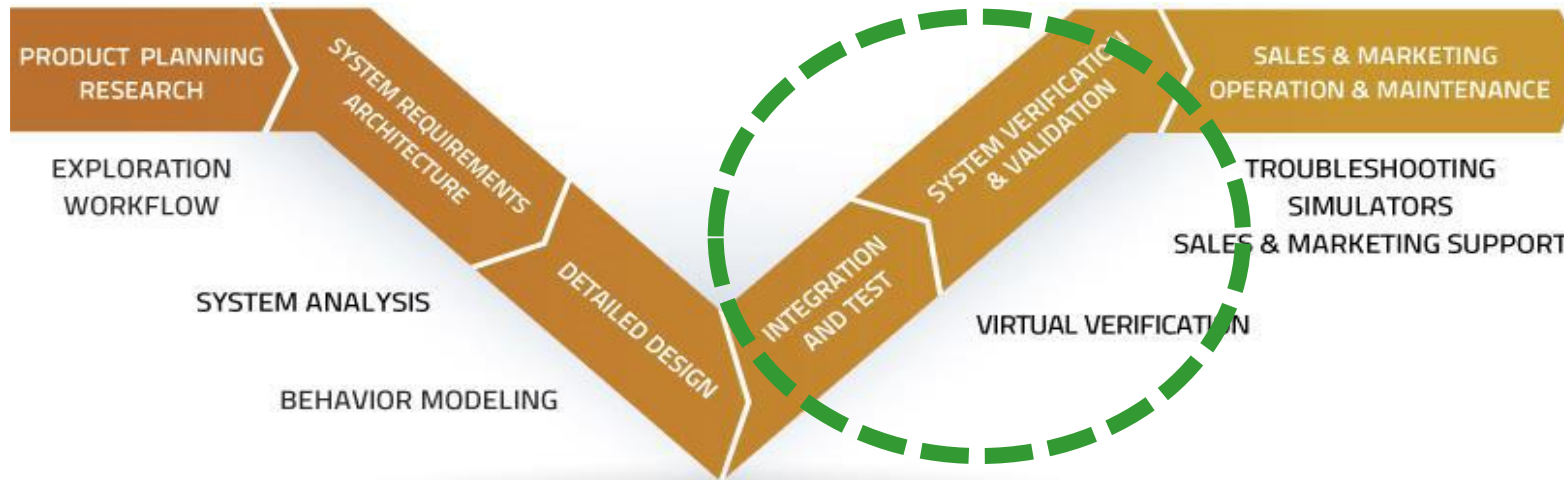
Yearly energy flows [GWh]



# Renewables integration and control

# LATE STAGE DEVELOPMENT

- Virtual design verification
- Implementation optimization
- Software verification
- Customer issue analysis

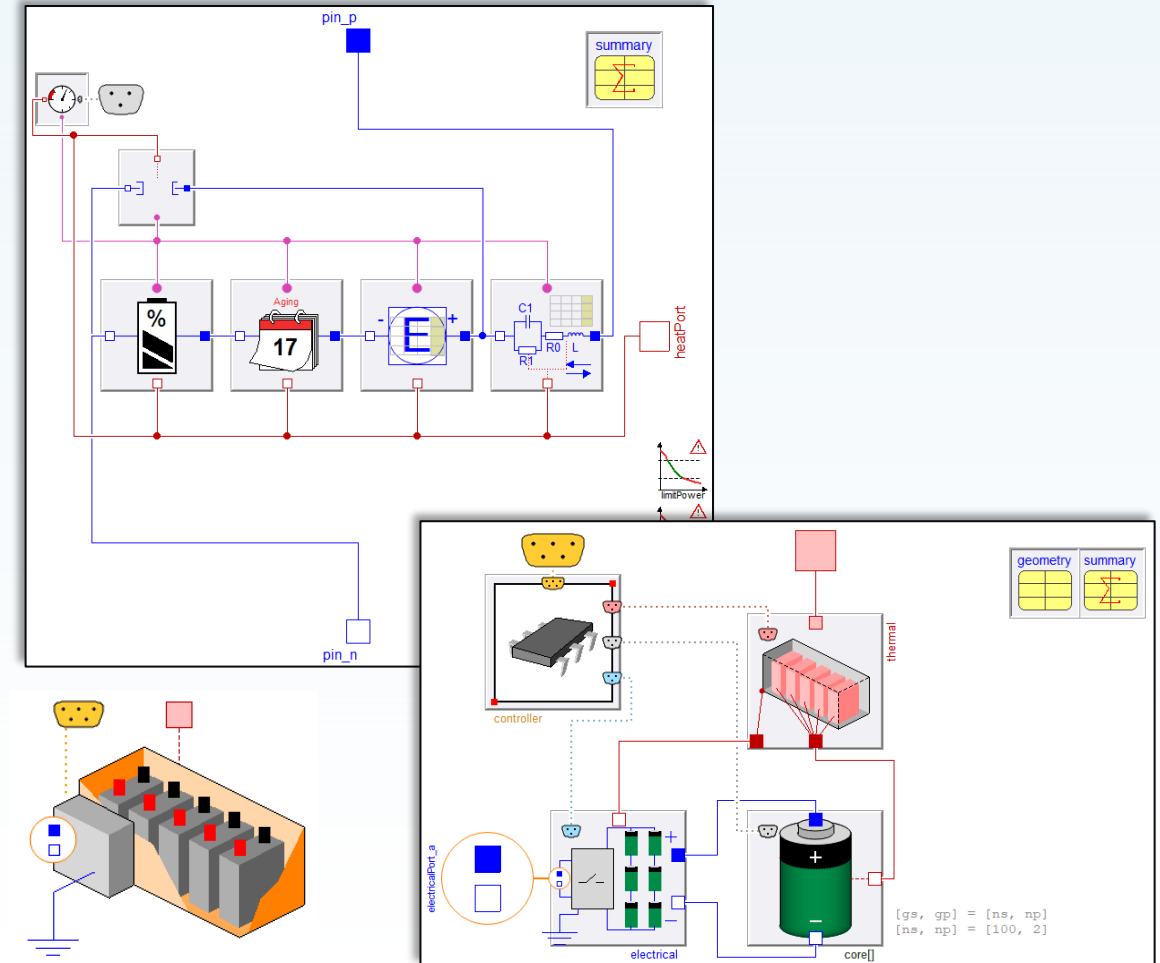


## Model characteristics

- Detailed 3 phase AC representation
- Current, voltage & frequency
- Grid feeding & grid forming controller
- Synchronization algorithm

# Electrification Library – Battery model

- From battery cell to module to pack
- Scalable fidelity: from lumped packs to individual cells
- Separate scaling of physical domains: core battery, thermal dynamics, electrical connections, controls
- Modular core battery models
  - Charge capacity
  - Voltage
  - Impedance
  - Self discharge
  - Aging
- Battery management control
- Cell imbalances



# Thermal Power Library – Photovoltaic panel models



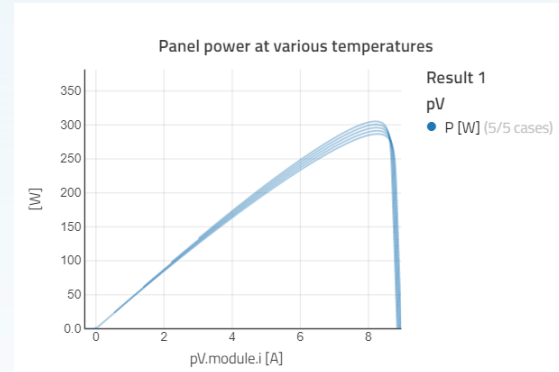
$$P = \eta P_{rat} \frac{irr}{irr_{ref}} (1 + \alpha(T - T_{ref}))$$

Simple efficiency model

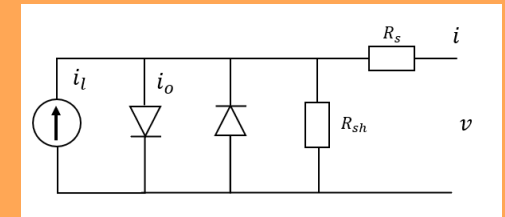
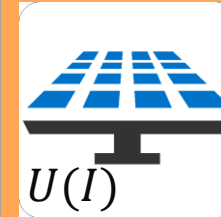
Low-fidelity

Targeting energy management

Power source for the whole PV plant



Reference conditions		
S_ref	:	1000 W/m²
T_c_ref	:	25 °C
AM_ref	:	1.5
Geometry and configuration		
A	:	1.95624 m²
n_cells	:	72
n_modules	:	1
Five parameter		
i_mp_ref	:	8.26 A
i_sc_ref	:	8.95 A
v_oc_ref	:	45.1 V
v_mp_ref	:	35.7 V
alpha_sc_ref	:	0.066/(100)*i_sc_ref
beta_oc_ref	:	-0.33/(100)*v_oc_ref



$$i = i_L - i_o \left( e^{\frac{v + R_s i}{a}} - 1 \right) - \frac{v + R_s i}{R_{sh}}$$

Single-diode 5 parameters model

Current/voltage map

Optional Maximal Power Point Tracking

Suitable for inverter control

By-pass diode around every module

Prepared for advanced heat transfer

Blocking diode in every string

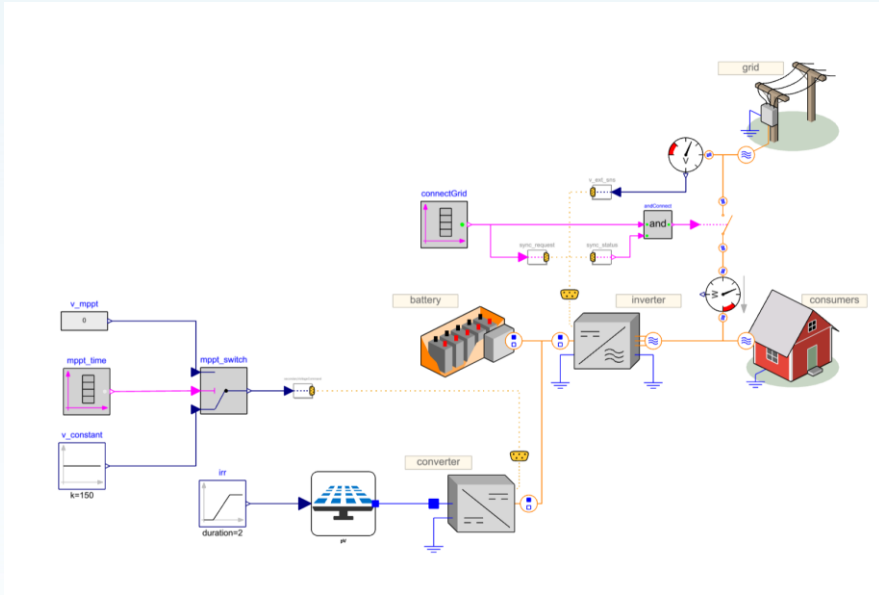
Hierarchical model from cell to array

ThermalPower.MicroGrid.RenewableEnergy.PhotoVoltaics.PhotoVoltaics\_efficiency

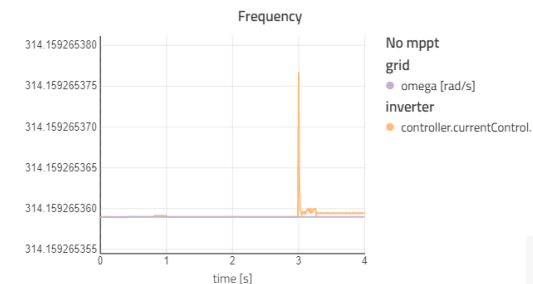
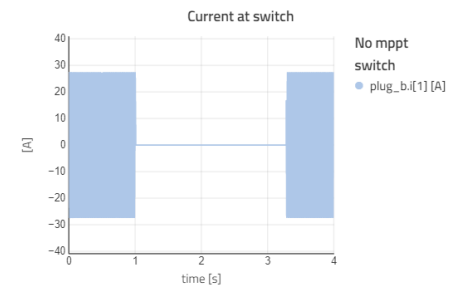
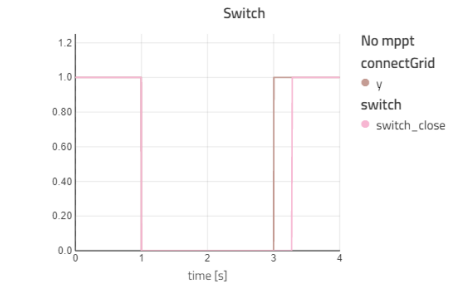
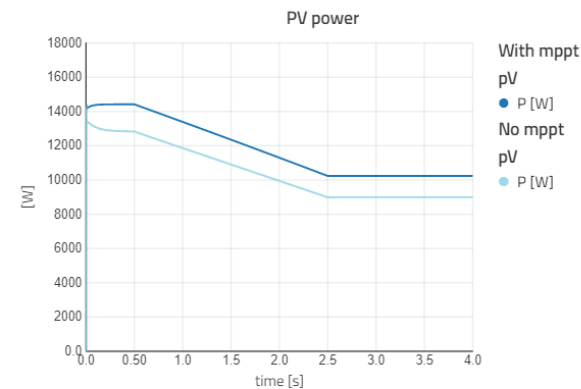
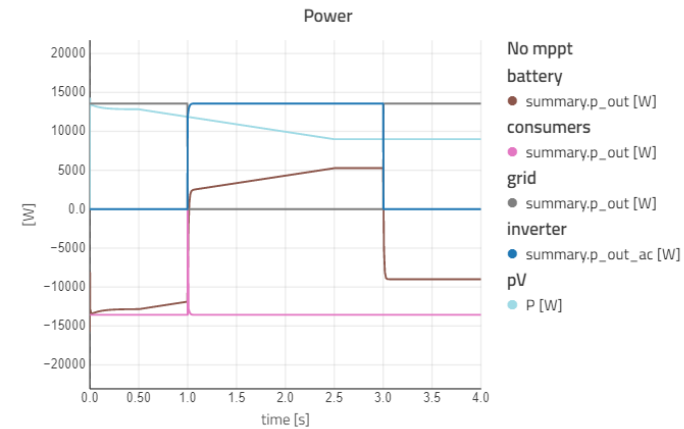
ThermalPower.MicroGrid.RenewableEnergy.PhotoVoltaics.Array



# Renewable and battery integration



Time [s]	Event	Inverter	Battery
0-1		Grid feeding, $P_{ref}=0$	Being charged by PV
1	Power outage		
1-3		Grid forming, voltage & frequency control	Being discharged to replace grid and meet the load demand
3.0	Connection request	Synchronizing with grid	
3.4-	Grid connected	Grid feeding, $P_{ref}=0$	Being charged by PV

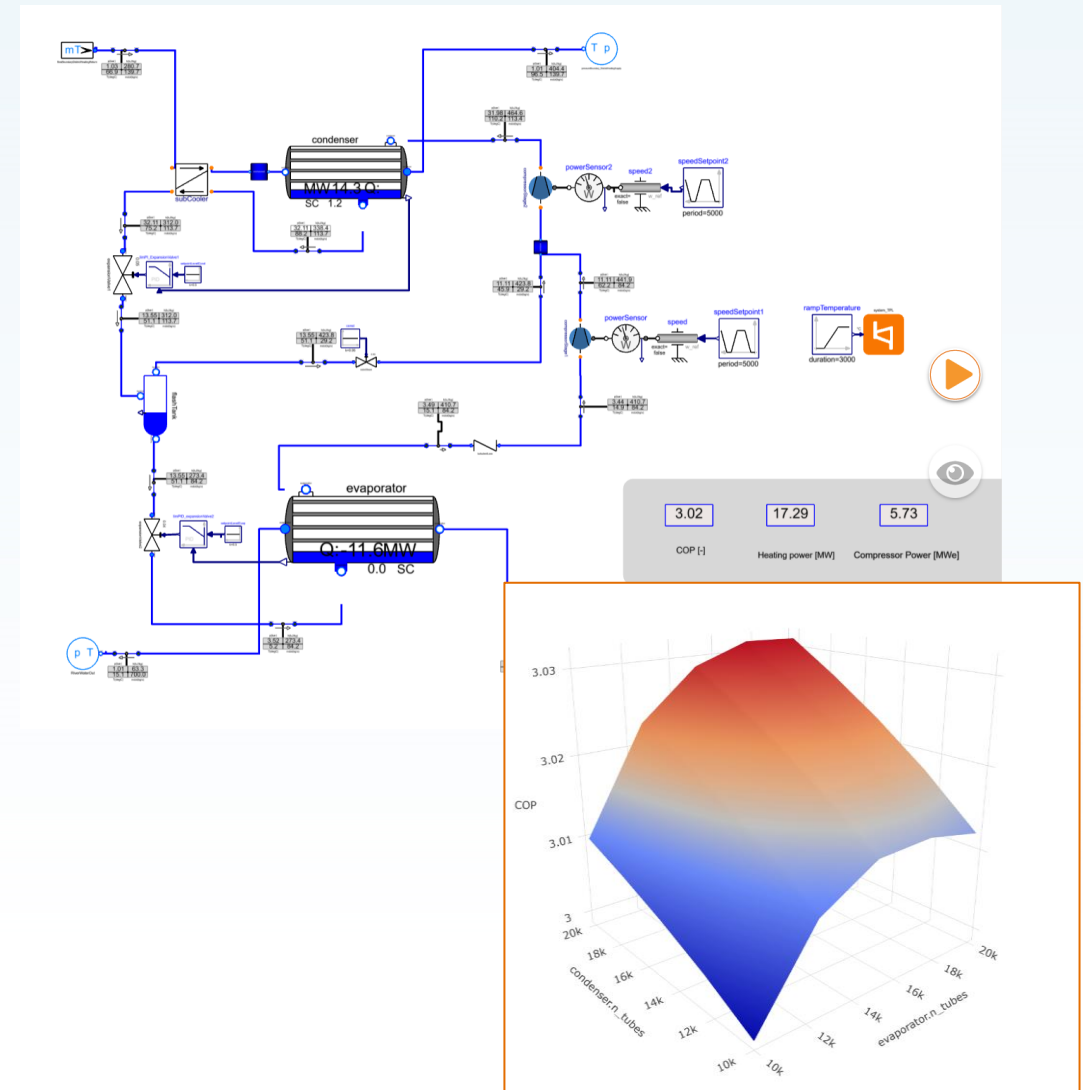


# Power to heat – Heat pump integration

- Detailed heat pump model Siemens SHP-600 added in 2022.2 release
- New design approach in realistic environment with closed loop system feedback!
- Allows heat pump and control strategy design for new electricity market grid services for heat pumps

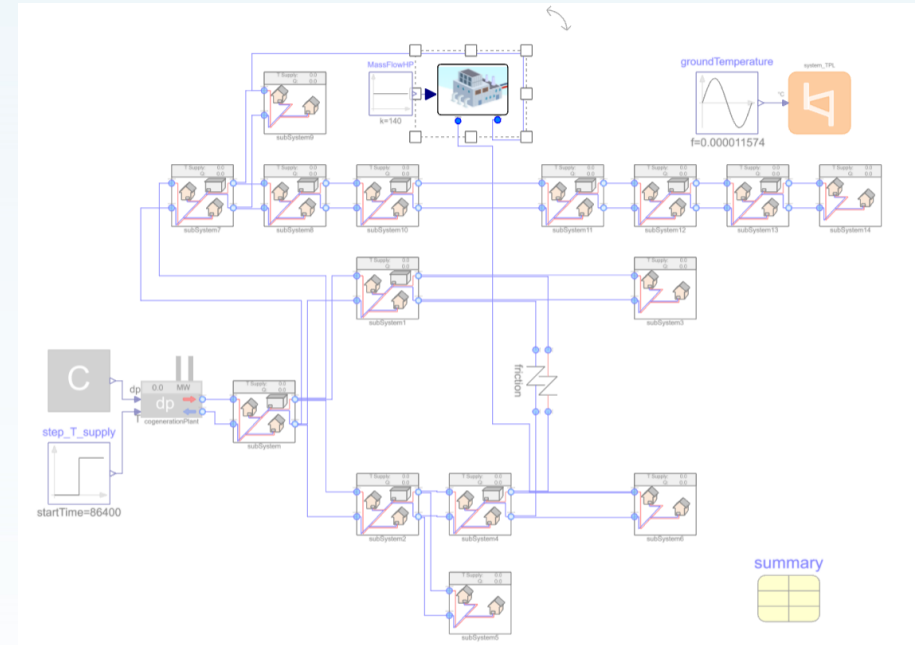
# New heat pump model Siemens SHP-600

- High-fidelity heat pump based on existing Thermal Power Library components useful for:
  - Basic design studies (heat exchanger geometry, compressor maps)
  - Working fluid studies
  - Basic control design
- Constant or varying boundary conditions without direct feedback – as state of the art for design workflows



# Heat pump integration for design verification

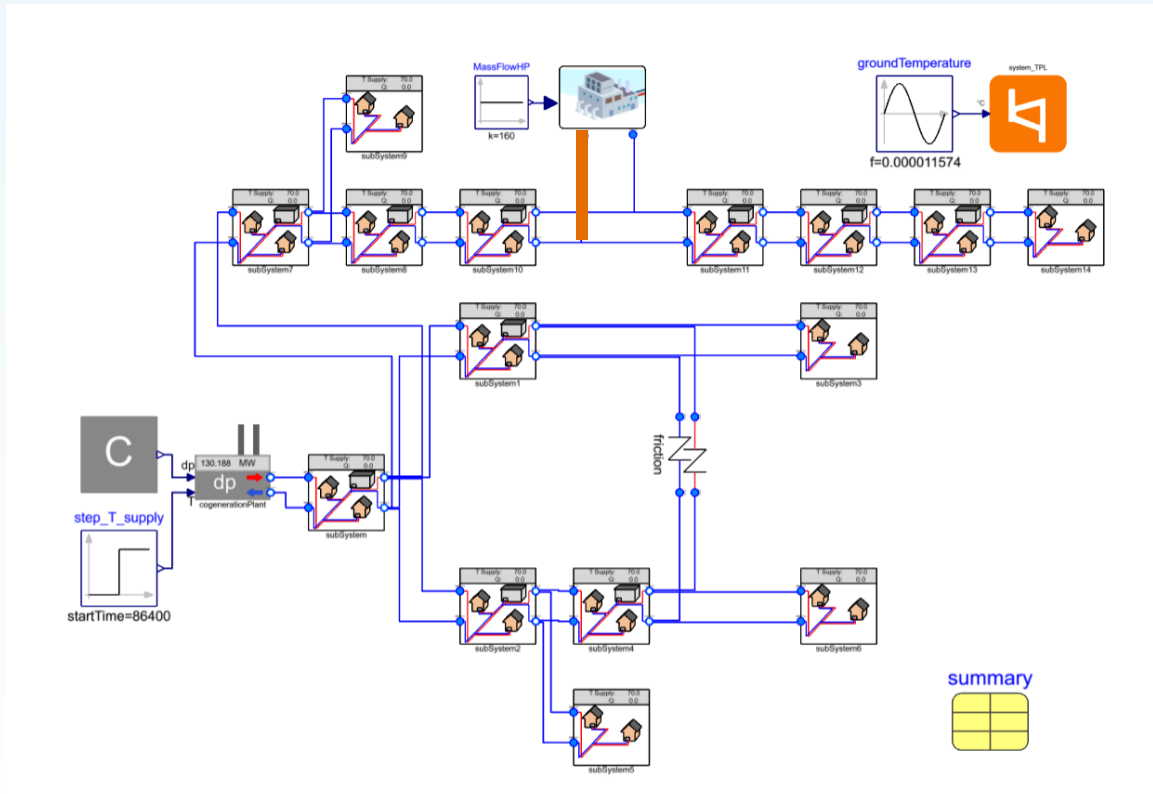
- Integration of the heat pump into a district heating system impacts heat pump performance and control stability:
  - Changing COP when change of network temperature.
  - Possible feedback of heat pump output provides additional challenges for heat pump control design!
- Not state of art for design but significant reduction of risk and effort for commission and field testing through coupled dynamic simulation



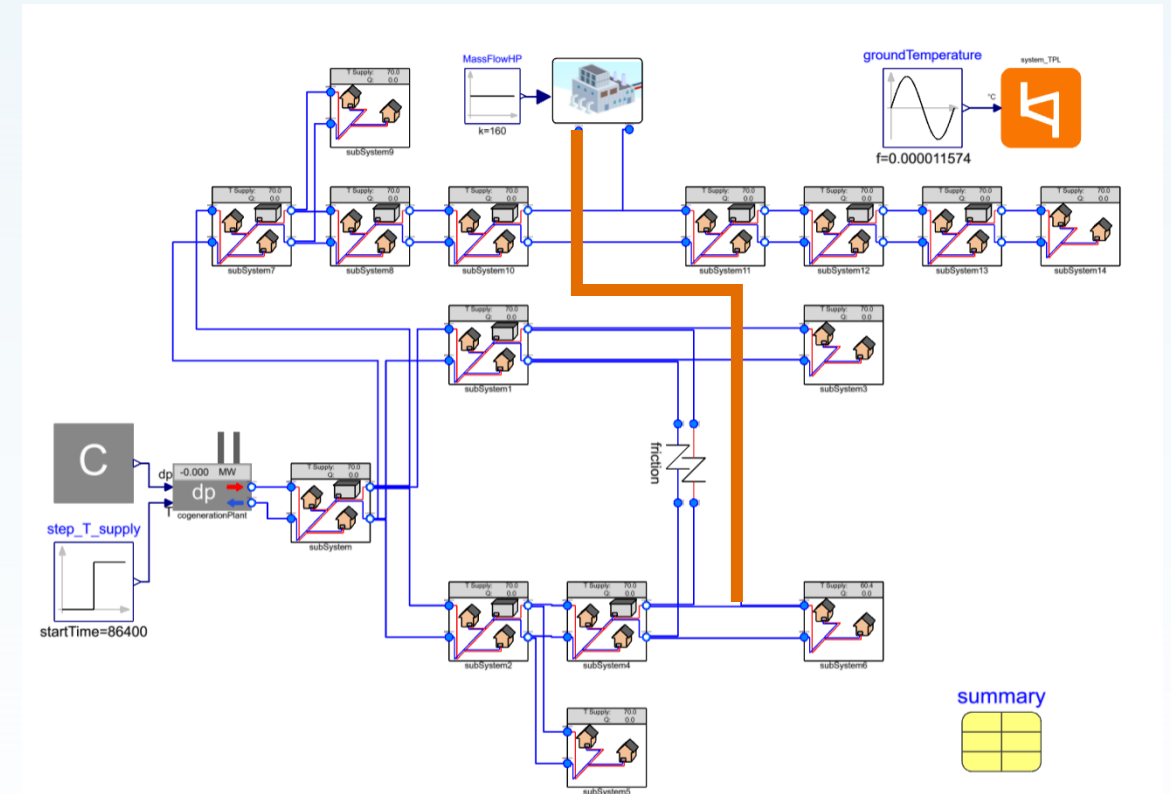
# Heat pump integration for studying electric grid services

- Heat pumps are preferably operated at times of low electricity prices - typically high renewables share, fewer stabilizing conventional units
- Heat pumps compressor can be used for demand side electricity reduction because heating systems provide high thermal inertia and potentially storage capacity.
- Effects on consumers while providing primary frequency control with heat pump compressor can be studied

# Heat pump integration for studying electric grid services



Config1: Heat pump inlet is connected with return flow (30°C)



Config2: Heat pump inlet is connected with remote feed (60°C)

# Conclusion

- Challenging engineering problems related to the energy transition
  - Large variety of technologies
  - Sector coupling
  - Design, controls & integration challenges
- Through various examples, we could should how system simulation & Modelon Impact can be used to address these challenges:
  - Feasibility assessment of hybrid energy projects
  - Integration of storage and renewables to the grid
  - Power-to-heat