

DAY-AHEAD DISPATCH OF AN ACTIVE DISTRIBUTION NETWORK HOSTING STOCHASTIC DISTRIBUTED GENERATION VIA GRID-AWARE CONTROL OF A BESS

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The control time scales for ADNs

	Problem	Required methods	Required technologies
mins-seconds	<ul style="list-style-type: none"> Renewables short-term volatility 	<ul style="list-style-type: none"> Real-time knowledge of the system state 	<ul style="list-style-type: none"> Distributed sensing (e.g. PMU) Real-time state estimators
time	<ul style="list-style-type: none"> Grid congestions Voltage control 	<ul style="list-style-type: none"> Exact optimal power flow Explicit control methods Stability assessment of complex systems (low inertia) 	<ul style="list-style-type: none"> Distributed storage (Demand response)
hours-minutes	<ul style="list-style-type: none"> Heterogeneous resources aggregation Ancillary services (system stability) 	<ul style="list-style-type: none"> Real-time estimation of system flexibility Robust optimization Short-term forecast 	<ul style="list-style-type: none"> Agent-based software frameworks Demand response

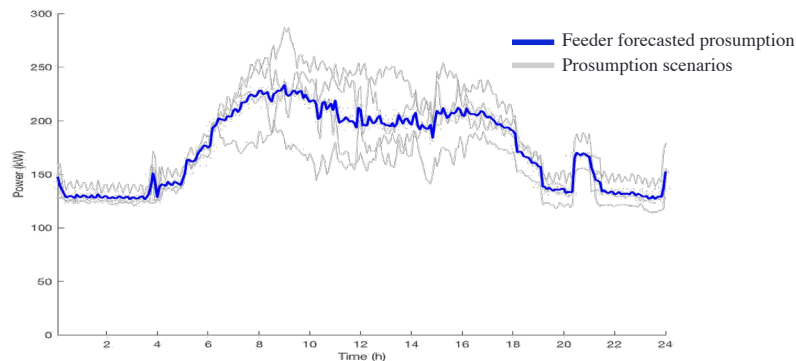
Objective

Experimental validation of day-ahead dispatchability of a distribution network hosting stochastic RES-based generation via grid-aware real-time control of a BESS

Control in two stages: a **day-ahead optimization** and a **real-time control**

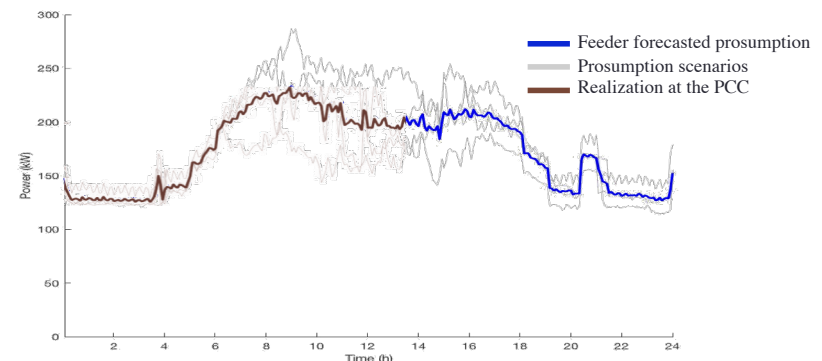
Optimal profile of the feeder power for the **next day** and determination of BESS offset profile:

- data-driven forecasting
- scenario-based optimization

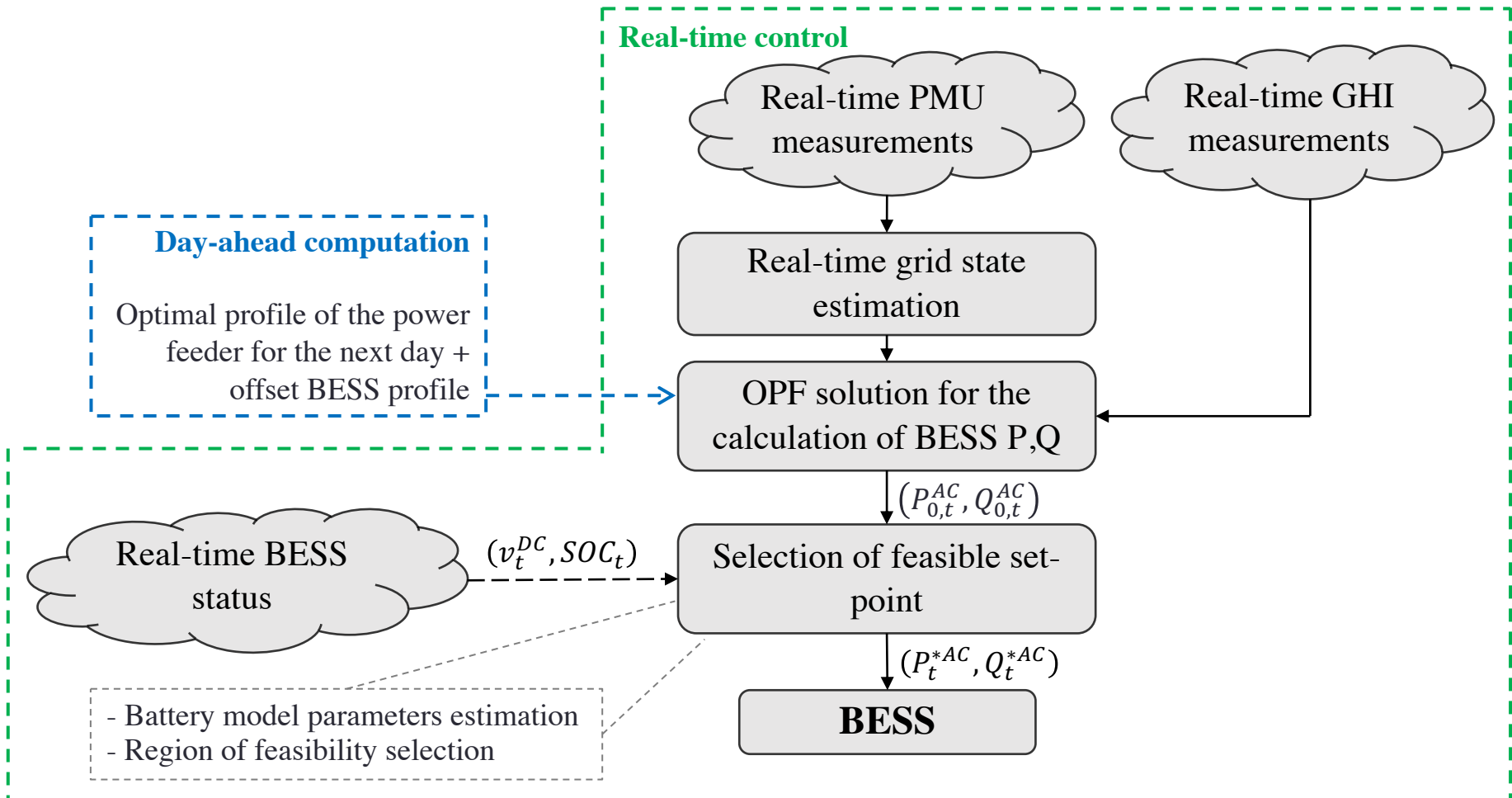


In **real-time**, the BESS is controlled to track the optimal profile:

- grid-aware OPF-based control
- battery equivalent circuit model



Overall framework



Dispatch plan definition

Day-ahead

Every 24 hours, we solve a **robust optimization** problem:

find:

- a dispatch plan for the next 24 hours using a scenario-based iterative AC OPF (**Codistflow**), which accounts for forecasts of RESs and load profiles with 95% confidence interval with 1h time resolution

such that:

- the **dispatch error** ($|\text{sum}(\text{dispatch plan} - \text{PCC power})|$) is **minimized** within 1h
- the BESS offset profile for **SoC compensation** is included

and such that:

- the BESS **energy limits** are respected
- the BESS **power limits** are respected
- the grid **ampacity** and **voltage constraints** are respected
- **end-of-day SoC** is within 10% around initial SoC

RT OPF-based BESS control

Real-time control

For each 1 hour slot, we solve **robust OPF** problems every 1 min, that considers the dispatch plan and BESS offset profile:

$i=1, 2, \dots, i^{\max}(=61)$

```
while  $i < i^{\max}$  do:
```

- solve ($i^{\max}-i$) OPF for each time step of the 1h interval in **receding time horizon**

```
  such that:
```

- the **dispatch error** ($|\text{sum}(\text{dispatch plan} - \text{PCC power})|$) is **minimized** within 1h
- the BESS offset profile for **SoC compensation** is included
- the **accumulated error** during the previous ($i-1$) timesteps is considered and **compensated**

```
  and such that:
```

- the BESS **energy limits** are respected
- the BESS **power limits** are respected
- the grid **ampacity** and **voltage constraints** are respected

```
end
```

Different OPF methods

Accuracy VS Computation Complexity

- **Linearized OPF [1]**

- The system states are modeled by the sensitivity coefficients which can be uniquely determined as a function of grid states and topology, and are assumed to be constant within the control time interval.

- **Second-order cone ACOPF (SOC-ACOPF) [2]**

- Relying on the branch flow formulation based on the transmission line Π -model.
- The original AC-OPF is convexified by employing SOC programming relaxation on the ampacity constraint associated to power losses
- The loop constraint of V phase angle is derived so that the branch flow model is valid also for meshed power networks.
- The feasible solution of the original AC-OPF can be recovered from the optimal solution of the SOC-ACOPF and the relaxation of the SOC-ACOPF model is tight under high power load conditions.

- **Augmented Relaxed OPF (AR-OPF) [3]**

- Relying on the branch flow formulation based on the transmission line Π -model.
- While employing the SOCP relaxation on the ampacity constr. associated to P losses, aux. variables related to the state variables (line P-flow, V and I) are introduced to build a set of augmented operating constraints to guarantee the exactness of the SOCP relaxation.
- The exactness is valid under mild conditions which holds for realistic radial distribution networks.

[1]. Gupta, Rahul, Fabrizio Sossan, and Mario Paolone. "Performance Assessment of Linearized OPF-based Distributed Real-time Predictive Control." *2019 IEEE Milan PowerTech*. IEEE, 2019.

[2]. Yuan, Zhao, and Mario Paolone. "Properties of convex optimal power flow model based on power loss relaxation." *Electric Power Systems Research* 186 (2020): 106414.

[3]. Nick, Mostafa, et al. "An exact convex formulation of the optimal power flow in radial distribution networks including transverse components." *IEEE Trans. on Autom Control* 63.3 2017: 682-697.

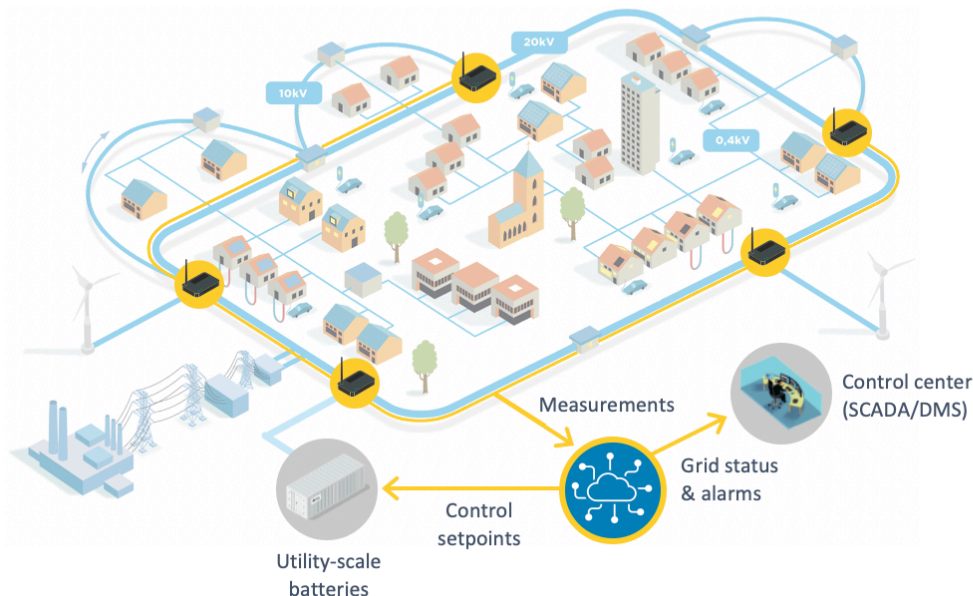
Employed state estimation method

Zaphiro develops the **first grid automation system based on high-speed & time-synchronized PMUs**



17 Zaphiro's PMU (Phasor Measurement Unit) devices:

- Time-synchronized
- High-speed measurements (50 meas/sec)



Modular and scalable big-data processing software platform



Real-time monitoring

→ Estimation of entire grid state up to 50/60 times per second



Outage management

→ Automated fault location to reduce the duration or even prevent blackouts



Battery control

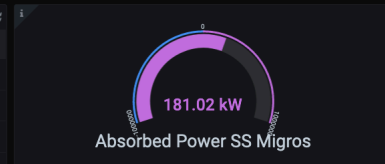
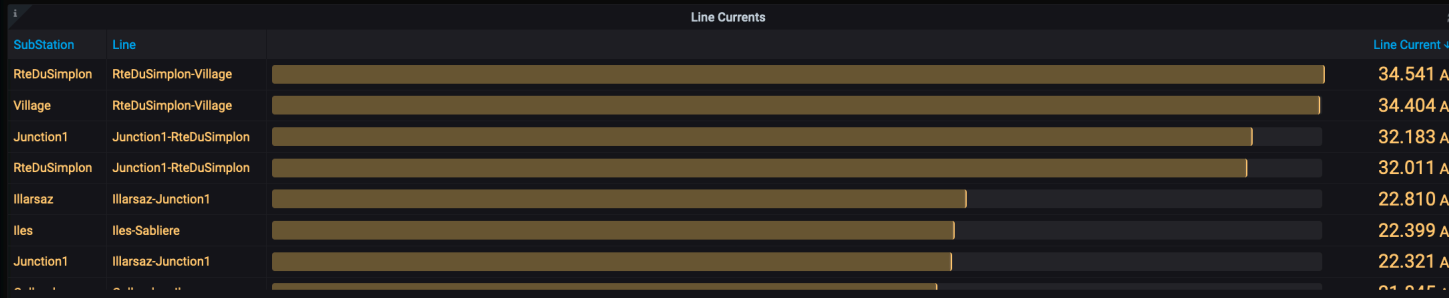
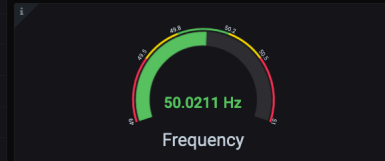
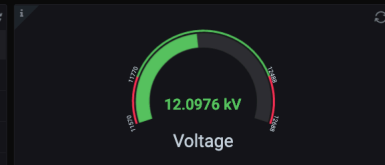
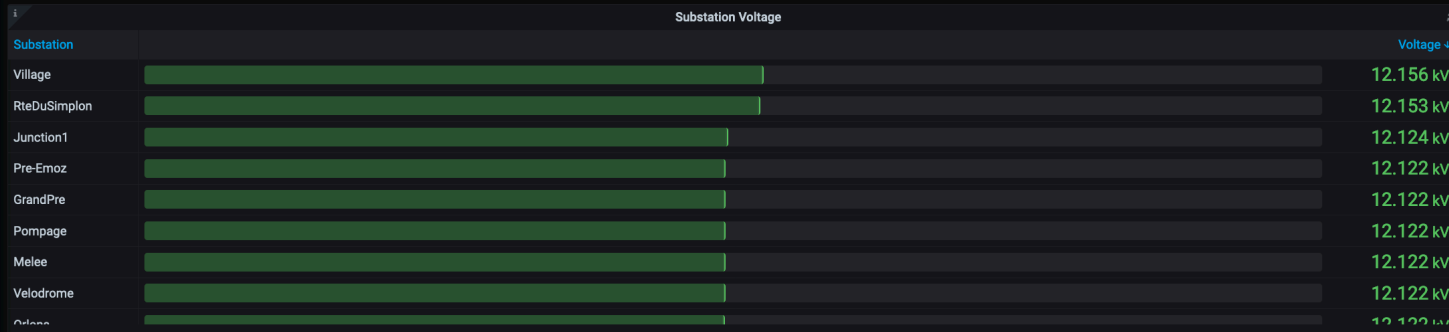
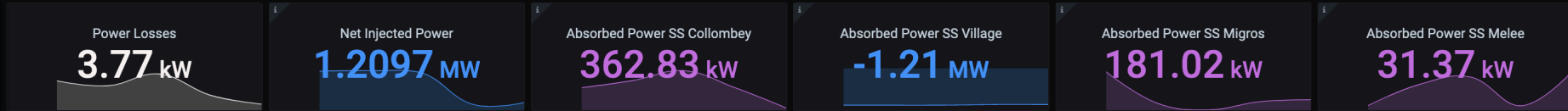
→ Control of a 1.5 MW battery to:

- Maximize PV generation
- Guarantee grid stability
- Provide ancillary services

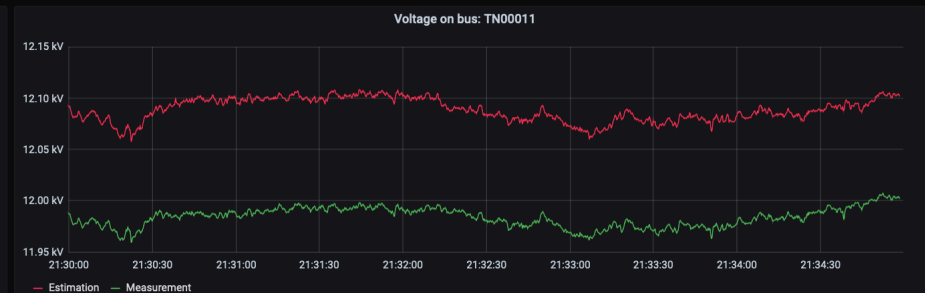
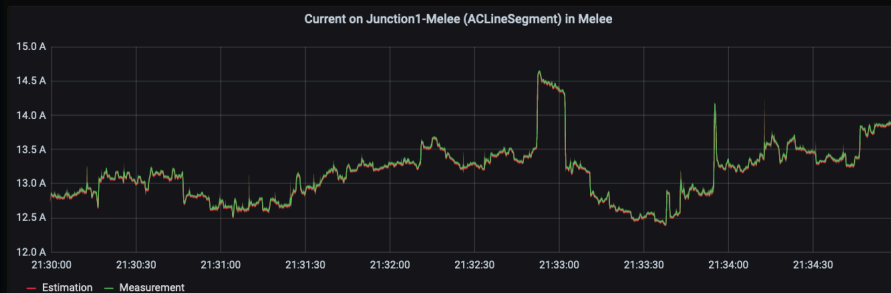


Zaphiro / Grid Overview ☆ 🔊

📊 📄 ⚙️ 🗨️ ⌚ Last 5 minutes 🔍 ↺ 5s



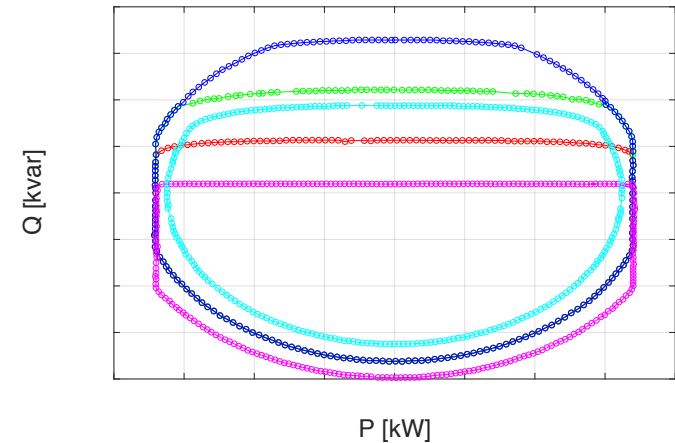
SubStation: Melee | Component Type: ALineSegment | Component Name: Junction1-Melee | Phase: A



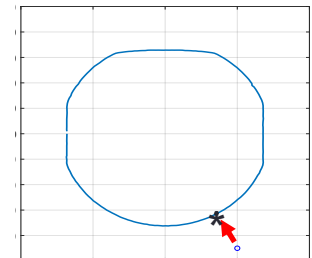
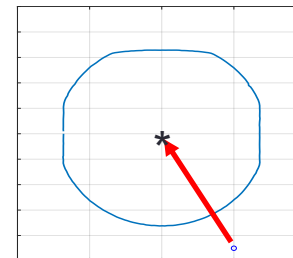
1.5 MVA/2.5 MWh BESS



$$h(P_t^{AC}, Q_t^{AC}, v_t^{DC}, v_t^{AC}, SOC_t) \leq 0$$

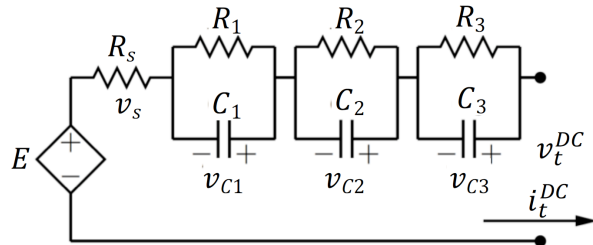


PQ capability curves as function of the real-time BESS status & grid status



BESS modelling

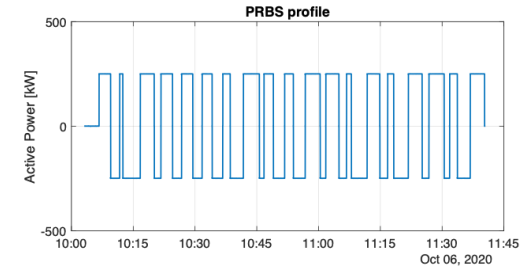
Equivalent battery TTC model



$$\begin{cases} C_1 \frac{dv_{C1}}{dt} + \frac{v_{C1}}{R_1} = \frac{v_s}{R_s} \\ C_2 \frac{dv_{C2}}{dt} + \frac{v_{C2}}{R_2} = \frac{v_s}{R_s} \\ C_3 \frac{dv_{C3}}{dt} + \frac{v_{C3}}{R_3} = \frac{v_s}{R_s} \end{cases}$$

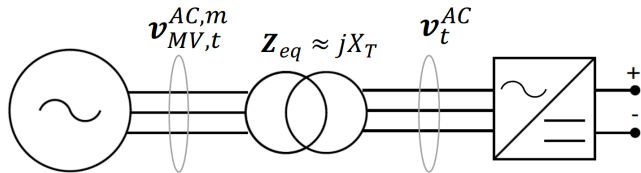
$$v_s + v_{C1} + v_{C2} + v_{C3} = E - v_t^{DC}$$

$$E(SOC_t) = a + b \cdot SOC_t$$



SOC	0-20%	20-40%	40-60%	60-80%	80-100%
a	100.0098597	100.016163	100.014469	100.0134207	100.0146099
b	549.2836773	245.2360282	284.9052456	344.9751672	324.8422745
R_s	0.009312694	0.008569196	0.008364214	0.007948302	0.007679508
R_1	0.003305801	0.003323378	0.002586195	0.002919781	0.003248674
C_1	7576.472133	8813.047231	5631.309052	7282.444433	7792.395409
R_2	0.000217164	0.000334839	4.53043E-05	4.17458E-05	0.003885566
C_2	1.00E+06	1.00E+06	1.00E+06	1.00E+06	1.00E+06
R_3	2.00E-06	3.51E-05	4.13E-06	4.17E-06	5.80E-04
C_3	1.00E+07	1.00E+07	1.00E+07	1.00E+07	1.00E+07

Reference BESS scheme for the AC voltage prediction



$$\mathbf{v}_t^{AC} = \mathbf{v}_t^{AC,m} + \mathbf{Z}_{eq} \text{conj}\left(\frac{\mathbf{S}_{0,t}^{AC}}{\sqrt{3}\mathbf{v}_t^{AC,m}}\right)$$

$$v_t^{AC} \approx \sqrt{(v_t^{AC,m})^2 + X_T^2 \frac{(P_{0,t}^{AC})^2 + (Q_{0,t}^{AC})^2}{3(v_t^{AC,m})^2}}$$

- Prediction of DC voltage (v_t^{DC}, SOC_t)
- Prediction of AC grid voltage (v_t^{AC})

$$h(P_t^{AC}, Q_t^{AC}, v_t^{DC}, v_t^{AC}, SOC_t) \leq 0$$

Converter feasibility region



Hydro power plant

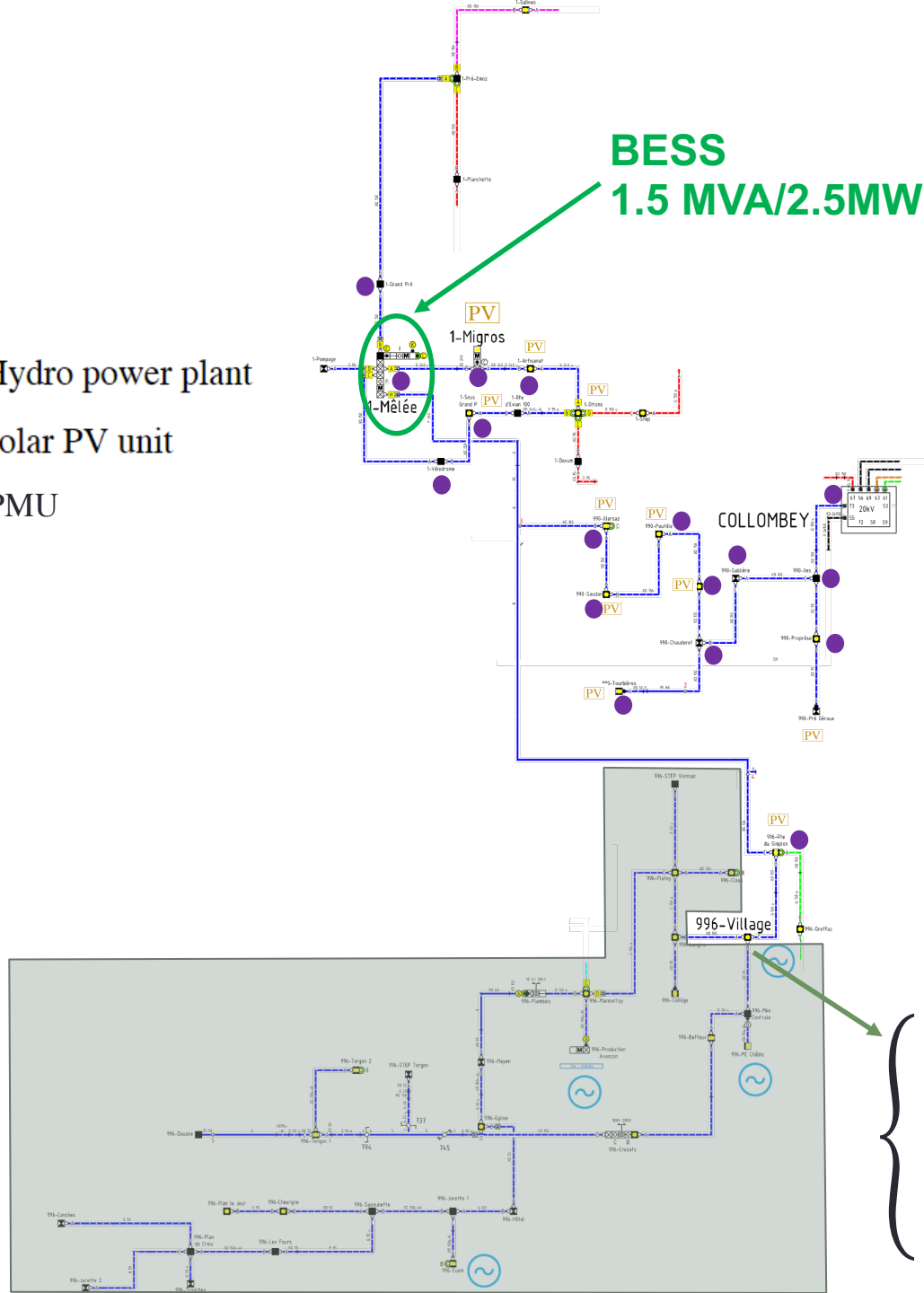


Solar PV unit



PMU

BESS
1.5 MVA/2.5MWh



Base voltage: 21 kV

Base 3-phase power: 6 MVA

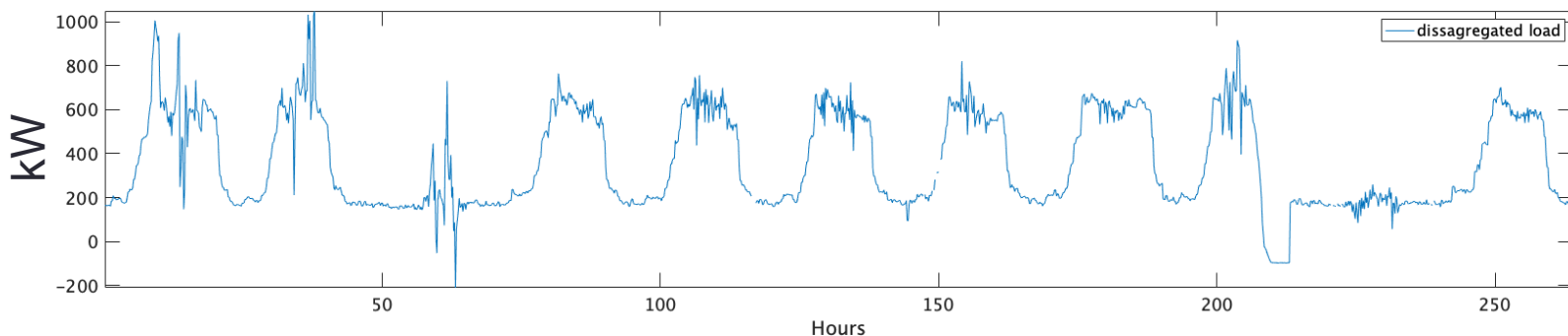
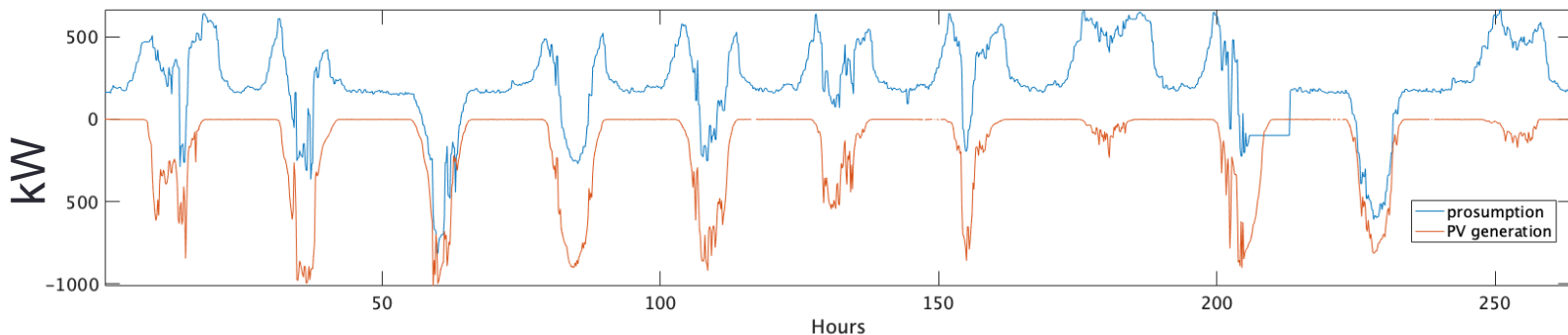
Total PV gen. capacity: 3.2 MWp
(1xMW-scale)

Total hydro gen. capacity: 3.4 MVA
(1xMW-scale)

17 PMUs distributed along the
network

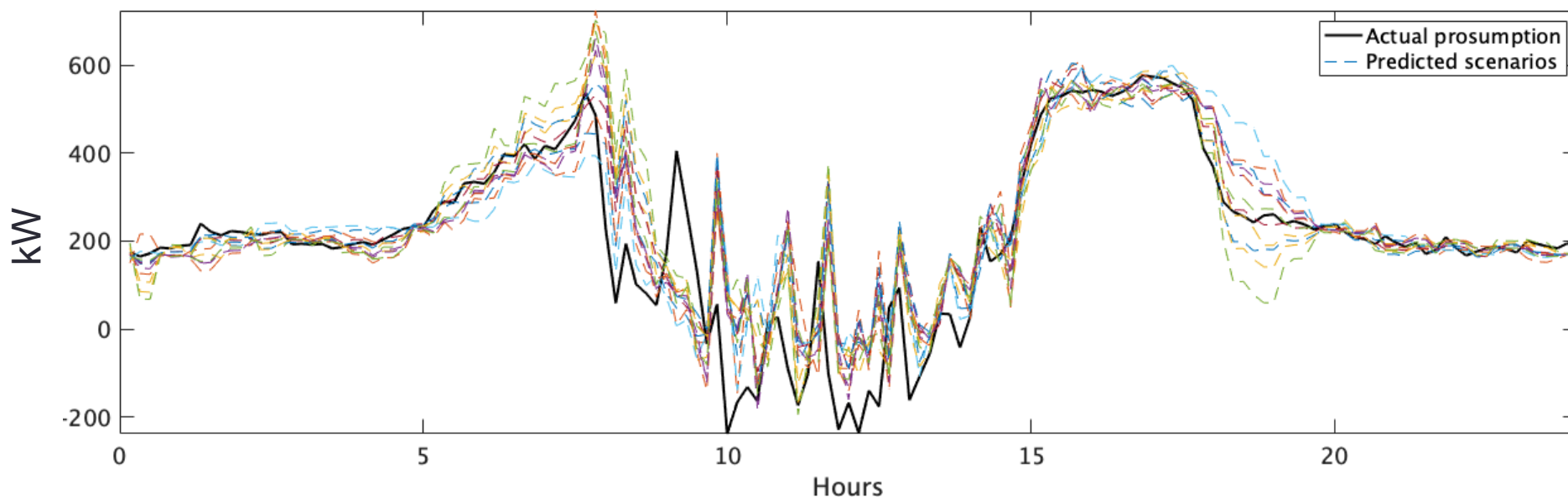
$$\left\{ \begin{array}{ll} \sum_i P_{load_i} ; & \sum_i Q_{load_i} \\ \sum_j P_{PV_j} ; & \sum_j Q_{PV_j} \\ \sum_k P_{hydro_k} ; & \sum_k Q_{hydro_k} \end{array} \right.$$

Prosumption data analysis and PV disaggregation

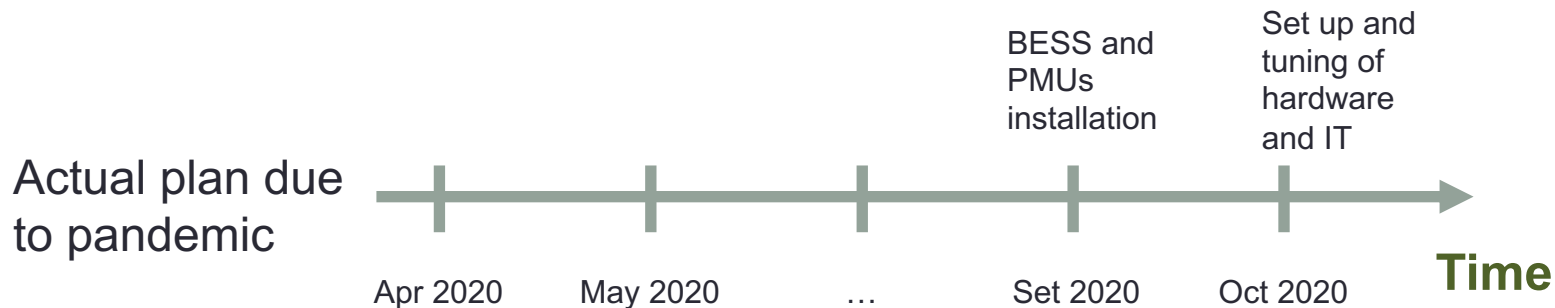
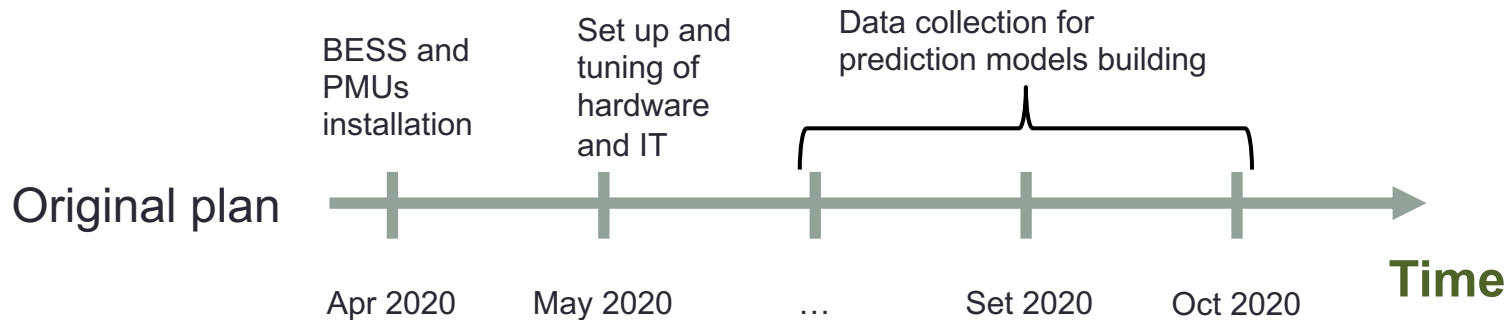


Day-ahead scenarios generation and Realization

27 October 2020



Where we are now



Conclusions

- We are deploying a framework for the day-ahead dispatchability of a distribution network hosting stochastic RES-based generation via grid-aware RT control of a BESS
- We have put in place a field experimental setup with advanced top-edge technology for the real-time monitoring and control of an ADN
- We have established field data collection and performed first analysis to assess the stochastic behavior of loads and distributed RESs after disaggregation
- We have performed BESS equivalent model identification tests for its optimal control
- An online disaggregation and forecasting tool for PV production and load consumption is operational.
- The RT dispatcher will be fully operational by mid-November



Thank you

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