

# **The EPFL smart grid platform**

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PATHFNDR lunch talk 03.02.2022



# **Research topics**

- Real-time situational awareness
- Machine-learning forecasting of renewables
- Interaction of MW-class renewable energy sources and energy storage systems
- Centralized vs decentralized control schemes
- IoT schemes applied to power systems
- Demand side management
- Self-healing grids





# **Overview of the infrastructure**

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# The medium-voltage infrastructure



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### **The low-voltage infrastructure**

Grid topology and devices (benchmark defined by the Cigré Task Force C6.04.02)



- Photovoltaic (PV) systems:
   30 kW, divided into three plants
- Load (L) emulators:
   30 kVA, three power electronic converters
- EV charging station: Chademo, DC charger, single/3-phase AC charger
- Supercapacitor (SC) storage system: 75 kW / 2 kWh.
- Battery (B) storage system:
   25 kW / 25 kWh, Lithium-Titanate-based
- Fuel Cell (FC):
   20 kW, under refurbishment
- Electrolyzer (EL): 5 kW
- H2/O2 storage (HOS):
   0.9 MWh @ 30 bar (200 bars max)

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### The low-voltage infrastructure





# Functions Time-deterministic sensing via PMUs

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# **Functions – Situational awarenes**

### Needs

Evolution of the whole power systems infrastructure

- major changes in their operational procedures (i.e. ctrl, protection);
- need of situational awareness tools to manage the increasing complexity of the grid;
- main involved aspect is the network monitoring by means of <u>Phasor Measurement</u> <u>Units</u> (PMUs);

PMU definition (as stated in IEEE Std.C37.118-2011): "A device that produces synchronized measurements of **phasor** (*i.e.* its amplitude and phase), **frequency**, **ROCOF** (*Rate of Change Of Frequency*) from voltage and/or current signals based on a **common time source** that typically is the one provided by the Global Positioning System UTC-GPS."

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# **Functions – Situational awarenes**

**Drivers** Availability of new technologies (e.g., precise time dissemination)

 $\rightarrow$  Join situational-awareness, protection and control schemes in power distribution grids



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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

### Window based Synchrophasor Estimation Algorithms

Class	Typical algorithms	Advantages	Drawbacks			
DFT based	Fourier analysis	Low computational complexity,	Spectral leakage, Harmonic interference, Off-nominal freq.			
	Interpolated DFT	harmonic rejection				
Wavelet based	Recursive wavelet	Harmonic rejection	Computational complexity			
Optimization based	WLS	They usually provide accurate	Non deterministic: driven by			
	Kalman Filter	other methods	optimality criteria			
Taylor series based	Dynamic Phasor	It intrinsically reflects the dynamic behaviors of power systems	Computational complexity			

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# **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

### Main sources of errors in DFT-based synchrophasor's estimation



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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

### **Possible corrections**

- 1. Aliasing
- Introduction of adequate anti-aliasing filters
- Increasing of the sampling frequency

- 2. Long range leakage
- Use of appropriate windowing functions

3. Short range leakage

4. Harmonic interference

Interpolated DFT methods

 Iterative compensation of the selfinteraction

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# **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

### Joint P+M class synchrophasor estimation – IpDFT solution for $\cos^{\alpha}$ windows

The IpDFT is a technique to extract the parameters  $f_0$ ,  $A_0$  and  $\varphi_0$  of a sinusoidal waveform by interpolating the highest DFT bins of the signal spectrum. It mitigates the effects of incoherent sampling  $(f_0/\Delta f \notin \mathbb{N})$ :

Interpolating the highest DFT bins → minimize spectral sampling



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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

Joint P+M class synchrophasor estimation – Enhanced-IpDFT algorithm



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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

### Joint P+M class synchrophasor estimation – Enhanced-IpDFT poor performance vs OOBI



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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems





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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems

			TVE [%]				FE [mHz]					RFE [Hz/s]							
		IEEE Std		i-IpDFT			IEEE Std		i-IpDFT			IEEE Std		i-IpDFT					
		Р	Μ	C	OS	Ha	ann	Р	Μ	с	os	Hann		P M		cos		Hann	
				SNR	[dB]	SNR	[dB]			SNR	[dB]	SNR	[dB]			SNR	[dB]	SNR	[dB]
12				60	80	60	80			60	80	60	80			60	80	60	80
Si	gn Freq	1	1	0.024	0.002	0.03	0.003	5	5	1.3	0.1	1.5	0.1	0.4	0.1	0.095	0.009	0.126	0.012
Harn	n Dist 1%	1	1	0.108	0.094	0.028	0.003	5	25	5.4	4.7	1.3	0.1	0.4	-	0.086	0.009	0.112	0.011
Harm	n Dist 10%	1	1	0.055	0.047	0.026	0.003	5	25	2	1.1	1.2	0.1	0.4	- 1	0.085	0.009	0.124	0.011
	$f_0=47.5{ m Hz}$	-	1.3	0.056	0.022	0.108	0.082	-	10	2.7	1.1	5.6	4.1	-	-	0.217	0.101	0.513	0.369
OOBI	$f_0 = 50  \text{Hz}$	-	1.3	0.026	0.003	0.033	0.004	-	10	1.3	0.1	1.7	0.2	-	-	0.104	0.009	0.153	0.013
	$f_0=52.5 \mathrm{Hz}$	-	1.3	0.043	0.004	0.044	0.011	-	10	2.1	0.2	2.2	0.6	-	-	0.143	0.022	0.150	0.032

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### **Functions – Situational awarenes**

Synchrophasors estimation in power distribution systems





# **Functions Real time situational awareness**

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### **Functions – Situational awarenes**

**Real-time state estimation - Methods** 

 Static SE: infers the system state by using only current time information (e.g., Weighted Least Squares – WLS – or Least Absolute Value methods).



Recursive SE: takes into account information available from previous time steps and predict the state vector in time (e.g., Kalman Filter – KF – method).



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### **Functions – Situational awarenes**

Example of installed sensors and PMUs



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# **Functions – Situational awarenes**

**RTSE** workflow



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# **Functions – Situational awarenes**





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### **Functions – Situational awarenes**

Example of RTSE performance (latency assessment)





# Applications Forecasting and dispatch

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# **Applications – Day-ahead dispatch**

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# $p_{1,t}^{+,\omega} \text{ Incoming active power at the slack} p_{1,t}^{-,\omega} \text{ Outgoing active power at the slack minimize}_{p_b,s^{\text{disp}}} \sum_{\omega \in \Omega} \sum_{t=1}^T \left\{ (s_{1,t}^{\omega} - s_t^{\text{disp}})^2 + \mu \left( (p_{1,t}^{+,\omega})^2 + (p_{1,t}^{-,\omega})^2 \right) + \lambda (p_{b,t}^{\omega})^2 \right\}$



subi	ject	to:

$\mathrm{SoE}_t^\omega = \mathrm{SoE}_{t-1}^\omega + T_s p_{b,t}^\omega$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$0 \le ((p_{b,t}^{\omega})^2 + (q_{b,t}^{\omega})^2) \le (P_{\max}^b)^2$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$aE_{\max}^b \le \operatorname{SoE}_t^\omega \le (1-a)E_{\max}^b$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$\Phi_{\Xi}(oldsymbol{p}_t^{\omega},oldsymbol{q}_t^{\omega}) \leq 0$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$p_{1,t}^{+,\omega} + p_{1,t}^{-,\omega} \ge q_{1,t}^{\omega} \tan(\pi/2 - \theta_m)$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$p_{1,t}^{+,\omega} + p_{1,t}^{-,\omega} \ge -q_{1,t}^{\omega} \tan(\pi/2 - \theta_m)$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$p_{1,t}^{\omega} = p_{1,t}^{+,\omega} - p_{1,t}^{-,\omega}$	$\forall t \in \mathcal{T}, \omega \in \Omega$
$p_{1,t}^{+,\omega} \ge 0, p_{1,t}^{-,\omega} \ge$	$\forall t \in \mathcal{T}, \omega \in \Omega.$

# **Applications – Day-ahead dispatch**

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Experimental validation on the LV microgrid



Day-ahead scenarios using PV and load forecasting

Optimally-determined day-ahead dispatch plan

Battery power injections and SoC for the scenarios

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# **Applications – Day-ahead dispatch**

Experimental validation on the LV microgrid





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# **Applications – Day-ahead dispatch**

Experimental validation on the LV microgrid using MPC



Real-time tracking of the dispatch plan

Battery power injection and SoC

PV curtailment action to help tracking the dispatch plan to avoid the saturation of the battery SoC.



# Applications Agent-based real-time control

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# Applications Clustering of ancillary services

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### **Applications – Assessment of power electronics ctrl**

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### Grid-forming (GFM)

Grid-following (GFR)



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### **Applications – Assessment of power electronics ctrls**

Multi-service framework

$$P = P_{ref} + \sigma_f \cdot (f - f_{ref})$$
$$Q = Q_{ref} + \sigma_v \cdot (v - v_{ref})$$

Day-Ahead<sup>1</sup>



 $\sigma_f, \sigma_v, \hat{P}_d$ 

1E. Namor, "Control of Battery Storage Systems for the Simultaneous Provision of Multiple Services." in IEEE Transactions on Smart Grid

Long term

prediction of prosumption

**Frequency time series** 

Voltage time series

**Dispatch Tracking<sup>2</sup>** Model Predictive Control (MPC)



$$P_{ref}, Q_{ref}$$

<sup>2</sup> F. Sossan, "Achieving the Dispatchability of Distribution Feeders Through Prosumers Data Driven Forecasting and Model Predictive Control of Electrochemical Storage," in IEEE Transactions on Sustainable Energy

Short term

prediction of prosumption

**BESS model** 

(TTC)

**Real Time<sup>3</sup>** Check capability curve 800 600 Ar = 300 V Mir = 600 V 400 000 [kvar] O -200 -400 -600 -800 -600 -400 -200 200 400 600 800 P [kW]  $f_{ref}, v_{ref}$ <sup>3</sup> Real-time Control of Battery Energy Storage Systems to Provide Ancillary Services Considering Dynamic Capability of DC-AC Converters

**Capability curve** 

**BESS model** 

Measured values (AC voltage, etc.)



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### **Applications – Assessment of power electronics ctrls**

Multi-service framework

$$P = P_{ref} + \sigma_f \cdot (f - f_{ref})$$
$$Q = Q_{ref} + \sigma_v \cdot (v - v_{ref})$$



Voltage time series

 $[\sigma_f^0, \boldsymbol{F}^o] = \operatorname*{arg\,max}_{\sigma_f \in \mathbb{R}^+, \boldsymbol{F} \in \mathbb{R}^N} (\sigma_f) \tag{4a}$ 

subject to:

$$SOE_0 + \frac{1}{E_{\text{nom}}} \left[ \frac{T}{N} \sum_{i=0}^n \left( F_i + L_i^{\uparrow} \right) + \sigma_f W_{f,n}^{\uparrow} \right] \le SOE_{\text{max}},$$
(4b)

$$SOE_0 + \frac{1}{E_{\text{nom}}} \left[ \frac{T}{N} \sum_{i=0}^n \left( F_i + L_i^{\downarrow} \right) + \sigma_f W_{f,n}^{\downarrow} \right] \ge SOE_{\text{min}},$$
(4c)

$$F_n + L_n^{\uparrow} + 0.2\sigma_f \ge P_{\max},\tag{4d}$$

$$F_n + L_n^{\downarrow} + 0.2\sigma_f \le P_{\max},\tag{4e}$$

### **Applications – Assessment of power electronics ctrls**

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 $P = P_{ref} + \sigma_f \cdot (f - f_{ref})$  $Q = Q_{ref} + \sigma_v \cdot (v - v_{ref})$ 

Day-Ahead<sup>1</sup>



 $\sigma_f, \sigma_v, \hat{P}_d$ 

<sup>1</sup>E. Namor, "Control of Battery Storage Systems for the Simultaneous Provision of Multiple Services," in IEEE Transactions on Smart Grid

> Long term prediction of prosumption

**Frequency time series** 

Voltage time series

Dispatch Tracking<sup>2</sup> Model Predictive Control (MPC)



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Short term prediction of prosumption

BESS model (TTC) The expected average composite power flow at PCC at the end of 5-minutes window is

$$G_k^+ = \frac{1}{30} \left( (k - \underline{k}) \cdot G_k + \sum_{j=k}^{\overline{k}} \hat{L}_{j|k} \right)$$

The **energy error** between the realization and the target in the 5-minute slot

$$e_k = \frac{300}{3600} \cdot (G_k^* - G_k^+ + \Delta G_k^F)$$

where the additional term  $\Delta G_k^F$  considers the **deviation caused by FCR** of the converter:

$$\Delta G_k^F = \frac{1}{30} \sum_{j=\underline{k}}^{k-1} (50 - f_j) \cdot \sigma_f$$

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### **Applications – Assessment of power electronics ctrls**

Multi-service framework

$$P = P_{ref} + \sigma_f \cdot (f - f_{ref})$$
$$Q = Q_{ref} + \sigma_v \cdot (v - v_{ref})$$

Day-Ahead<sup>1</sup>



Long term prediction of prosumption

**Frequency time series** 

Voltage time series

**Dispatch Tracking<sup>2</sup>** Model Predictive Control (MPC)



$$P_{ref}, Q_{ref}$$

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> Short term prediction of prosumption

> > **BESS model** (TTC)



Measured values (AC voltage, etc.)

# **Applications – Assessment of power electronics ctrls**

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# **Applications – Assessment of power electronics ctrls**

Prosumption (net demand) scenarios

- Power and energy budgets are allocated to compensate the forecasting uncertainty of stochastic PV production and demand.
- The remaining energy budget is allocated for the FCR service (resulting in a droop of σ<sub>f</sub> = 116 kW/Hz).



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### Apps – Assessment of power electronics ctrls Experimental results

- The grid-forming converter-controlled BESS corrects the prosumption (in dashed red) such that the PCC power (in shaded grey) is tracking the dispatch plan (in black).
- The deviation of the PCC power from the dispatch plan is the result of BESS providing FCR service.
- BESS SOE is contained within its physical limits all over the day (as well as other constrained variables not shown here).



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# **Applications – Assessment of power electronics ctrls**

**Experimental results** 

- Post-process analysis of the local grid frequency associated to gridforming and Grid-following experimental sessions.
- Relative Rate-of-Change-of-Frequency (rRoCoF) [Hz/s/W]

$$rRoCoF = \left|\frac{\Delta f}{\Delta P}\right|$$

This **metric is independent from the actual frequency variation** since the RoCoF is divided by the delivered BESS power.

# **Applications – Assessment of power electronics ctrls**





- **Case 1**: the 24 hour-long experiment with GFM-controlled BESS providing multiple services.
- Case 2: a 15-minute window around the hourly transition (i.e., 00:00 CET) for the same day-long experiment.

[Hz/s/W]

• **Case 3:** a dedicated 15-minute experiment around the hourly transition with the GFR-controlled BESS providing only FCR (droop of 1440 kW/Hz).

1.5

 $\times 10^{-3}$ 

• **Case 4**: a dedicated 15-minute experiment around the hourly transition with the GFL-controlled BESS is providing only FCR (droop of 1440 kW/Hz).



# **The PATHFNDR activities**

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### **Motivations**

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A primer on Swiss electricity market

- Day-ahead market is organized as a uniform auction with hourly contracts
  - Opens 45 days before delivery time and cleared the day before operation at 11.00.
  - Minimum bid size and step is 0.1 MW with prices between -500 to 3000 Euro/MWh.
- Given the day-ahead results, the **balancing responsible parties** (BRPs) of buyer and seller have to submit their schedules to the TSO (Swissgrid) until 14.30 the day before delivery.
- Balancing groups (BGs) represented by BRPs, are used for three purposes
  - Quantification of energy delivered,
  - coordination and accounting between TSO and market participants,
  - trade in day-ahead and intra-day markets.
- Swissgrid verifies that the schedules match based on day-ahead and BRPs input.
- BGs are not constrained geographically.

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# **The PATHFNDR setup**



1. *Improving performance - efficiency, resilience cost competitiveness* 



3. **Feeding sector coupling** – evaluate technologies, business mdoels



2. **Enabling flexibility** assessing flexibility across various sectors

- Flexible resources across different sites can be controlled to provide an aggregated flexibility,
- Could use existing platforms like *ReMap* to connect resources at DESL-EPFL, PSI, EMPA, HSLU etc.

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# Aggregation of DERs flexibilities in distribution grids

- Modeling of local constraints
  - Distribution grids (model-based or model-less)
  - Flexible assets
    - BESSs, Super-caps
    - PVs, EVs, Res. dem.
    - EL+FC .. etc.
- Aggregation
  - Forecast of stochastic flexibilities
  - Allocation of resources
- Communication
  - Common IT infrastructure for all the assets to communicate at scheduling/control stage.
  - Historian and RT Monitoring.



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# Multi-grid aggregation case study (simulation)





### **Performance** assessment





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# **Final remarks**

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### **Final remarks**

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- The EPFL smart grid platform is an ongoing project for the innovative and sustainable management of stochastic energy resources, power generation facilities and end-users.
- It represents an advanced model for students, research staff, industry, authorities and the general public to develop technologies for the operation of future power distribution systems and their coupling with other energy systems.
- The involvement of the platform within the PATHFNDR project will demonstrate how to coordinate multi-site and multi-time dispatching of geographically-distributed microgrids that mutualise power/energy flexibilities made available by fully-controllable and stochastic energy resources.