



### Increasing the accuracy of PV plants and power system dynamic models: a comparison of benefits for battery capacity sizing

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- 1. Introduction
- 2. Methodology
- 3. PV transients analysis
- 4. Comparison of battery capacity sizing methods
- 5. Conclusion



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# Introduction

#### Renewable energy integration into isolated industrial grids is becoming a key lever to reduce CO2 emissions

#### **Characteristics of industrial microgrids**

- Grid integration of Solar PV in large scale system poses a problem of reliability and power quality
- Strong relationship between solar drops and battery capacity







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# Introduction

- Battery sizing methodologies mostly rely on:
  - 1. A description of the electrical system
    - Large bench of modeling solution from coarse energy level to fine electrical description
    - Global trend in increasing the complexity of the electrical system model in battery sizing studies
  - 2. Solar intermittency scenarios
    - Assumption on the rate of power change in a time interval
    - Less covered in the literature involves complex phenomenon and is subject to high uncertainties
- Research questions :
  - Where should we investigate ?
- Methodology :
  - Identification of solar-power intermittency scenario
  - Improving solar-power dynamic models
  - Compare the gain in battery requirements



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# Improving intermittency scenarios

Worst case scenarioidentification

Statiscical analysis of 1sec irradiance data @Hawaï using ramp detection algorithm





Apply Wavelet-Variability Model to simulate a 90MW plant output (smooth-out 1sec profile)



Identify the worst PV drop

# Clear impact of the smoothing effect:

Single sensor:

• Worst RR : 13,5 %/s

90MW (Smoothed data) :

• Worst RR : 1,85%/s

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### Comparison of battery capacity sizing methods

Battery capacity is evaluated thanks to:

- 2 PV drop scenarios
- 2 system description

#### **Case study :**

- 90MW PV
- 4 gas turbines (54MW)
- 150 MW load



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#### Results

- The maximum PV penetration without battery varies from 9MW up to 44MW
- Battery capacity varies from 7MW to 60 MW...
- ...meaning from 4,4M\$ to 37M\$ of battery capex

There is more benefits to model PV variability smoothing than increasing the complexity of sizing procedure



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# Conclusions

- Work summary :
  - Methodology to identify a reliable scenario for PV intermittency is proposed
  - The Wavelet Variability Model is applied to simulated the real power output of a 90MW plant
  - A microgrid battery energy system is sized using both scenario and two sizing methodology with varying levels of complexity

• Results show that refining the variability scenario has more potential than increasing the complexity of electrical system model



Take away : Accurate modelling of PV intermittency should be a focus in isolated microgrid studies.





# Thank you for your attention

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### References I

- IRENA, "Innovation Outlook: Renewable: Mini-grids," p. 184, 2016.
- J. Lian, Y. Zhang, C. Ma, Y. Yang, and E. Chaima, "A review on recent sizing methodologies of hybrid renewable energy systems,"

#### Energy Convers. Manag., vol. 199, p. 112027, Nov. 2019,

• S. Sinha and S. S. Chandel, "Review of software tools for hybrid renewable energy systems,"

#### Renew. Sustain. Energy Rev., vol. 32, pp. 192–205, Apr. 2014

- HOMER Energy, "HOMER Hybrid Renewable and Distributed Generation System Design Software."
- S. Mashayekh et al., "Security-Constrained Design of Isolated Multi-Energy Microgrids," IEEE Trans. Power Syst., vol. 33, no. 3, pp. 2452–2462, May 2018
- P. S. Kundur, Power system stability and control, Indian edition.

#### Mc Graw Hill Education, 1994.

- R. Blaga and M. Paulescu, "Quantifiers for the solar irradiance variability: A new perspective," Sol. Energy, vol. 174, pp. 606–616, Nov. 2018.
- K. Lappalainen, G. C. Wang, and J. Kleissl, *"Estimation of the largest expected photovoltaic power ramp rates,"* Appl. Energy, vol. 278, p. 115636, Nov. 2020, doi: 10.1016/j.apenergy.2020.115636
- P. Lauret Et. al, "Characterization of the intraday variability regime of solar irradiation of climatically distinct locations," Sol. Energy, vol. 125, pp. 99–110, Feb. 2016



## References II

• A. Mills et al., "Dark Shadows,"

IEEE Power Energy Mag., vol. 9, no. 3, pp. 33-41, May 2011

- J. Marcos, et. Al "From irradiance to output power fluctuations: the PV plant as a low pass filter," Prog. Photovolt. Res. Appl., vol. 19, no. 5, pp. 505–510, 2011
- D. Cormode et. Al. "Comparing ramp rates from large and small PV systems, and selection of batteries for ramp rate control," 2013 IEEE 39th Photovoltaic Specialists Conference (PVSC), Tampa, FL, USA, Jun. 2013, pp. 1805–1810
- M. Lave, J. Kleissl, and J. S. Stein, "A Wavelet-Based Variability Model (WVM) for Solar PV Power Plants," IEEE Trans. Sustain. Energy, vol. 4, no. 2, pp. 501–509, Apr. 2013,.
- M. Lave and J. Kleissl, "Cloud speed impact on solar variability scaling Application to the wavelet variability model," Sol. Energy, vol. 91, pp. 11–21, May 2013.
- M. A. Hannan, M. Faisal, P. Jern Ker, R. A. Begum, Z. Y. Dong, and C. Zhang, "Review of optimal methods and algorithms for sizing energy storage systems to achieve decarbonization in microgrid applications
  - ," Renew. Sustain. Energy Rev., vol. 131, p. 110022, Oct. 2020
- K. Anoune, M. Bouya, A. Astito, and A. B. Abdellah, "Sizing methods and optimization techniques for PV-wind based hybrid renewable energy system: A review,"

Renew. Sustain. Energy Rev., vol. 93, pp. 652-673, Oct. 2018,.

• S. Jayashree and K. Malarvizhi, "Methodologies for Optimal Sizing of Battery Energy Storage in Microgrids : A Comprehensive Review," in 2020 International Conference on Computer Communication and Informatics (ICCCI), Jan. 2020, pp. 1–5.

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# References III

- M. Sengupta and A. Andreas, "Oahu Solar Measurement Grid (1-Year Archive): 1-Second Solar Irradiance; Oahu, Hawaii (Data)."
- M. Lave, "Solar variability zones: Satellite-derived zones that represent high-frequency ground variability," Sol. Energy, p. 10, 2017.
- M. Lave, M. J. Reno, and R. J. Broderick, "Characterizing local high-frequency solar variability and its impact to distribution studies," Sol. Energy, vol. 118, pp. 327–337, Aug. 2015
- A. Makibar, L. Narvarte, and E. Lorenzo, "On the relation between battery size and PV power ramp rate limitation," Sol. Energy, vol. 142, pp. 182–193, Jan. 2017.
- J. Marcos, O. Storkël, L. Marroyo, M. Garcia, and E. Lorenzo, "Storage requirements for PV power ramp-rate control," Sol. Energy, vol. 99, pp. 28–35, Jan. 2014
- A. A. Jahromi et al., "Battery Energy Storage Requirements for Mitigating PV Output Fluctuations," 2018 IEEE PES Innovative Smart Grid Technologies Conference Europe (ISGT-Europe), Oct. 2018, pp. 1–5
- P. Bornard, "Conduite d'un système de production-transport," Tech. Ing. Réseaux Électr. Transp. Répart.
- E. Alves, S. Sanchez, D. Brandao, and E. Tedeschi, "Smart Load Management with Energy Storage for Power Quality Enhancement Wind-Powered Oil and Gas Applications,".

Energies, 2019





# Back-up slides

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# Adressing solar power intermittency

The overall solar dynamics is a combination of 2 effects :

#### Factor impacting solar variability (GHI)

Cloud movements are dependent of :

- Climate zone
- Orography
- Seasons

Variability indicators are independent from a site to another.

Pushes to use a worst-case dataset or carry a measurement campaign @ site

Single sensor irradiance GHI<sub>plane of array</sub>





- The power plant size
- Power plant shape
- Scattering of the plant

The plant's topology has a smoothing effect on the variability. This results in lower ramps at the output of the central inverter

Power plant aggregated irradiance  $\phi(GHI)$ 

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