





### Effective Area Inertia:

Stability **Challenges** PMU-Based **Metering** & Machine Learning Forecasting



### Background: Inertia & Challenges

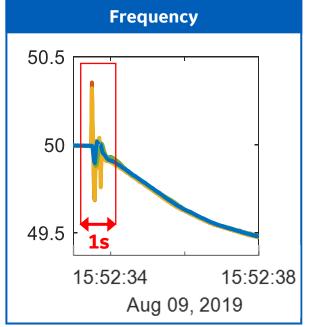
### Power System Disturbances: Centres of Inertia

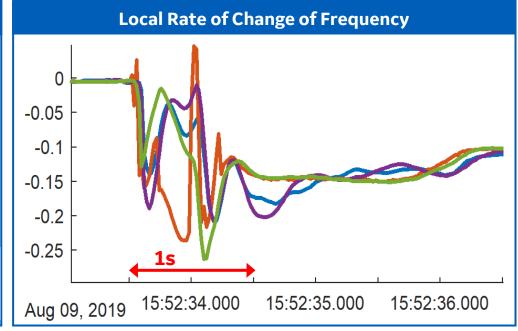
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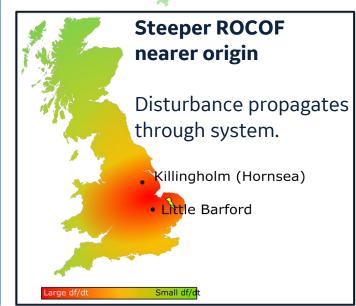
A power system behaves as area **centres of inertia** ("masses") **linked by the network** ("springs")

Significant spread of Frequency & RoCoF across a grid during events

Example: Great Britain 9<sup>th</sup> August 2019







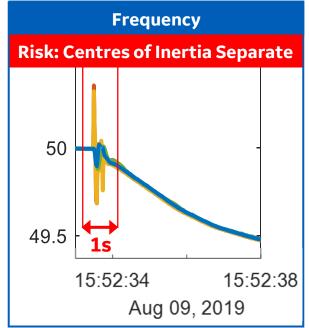
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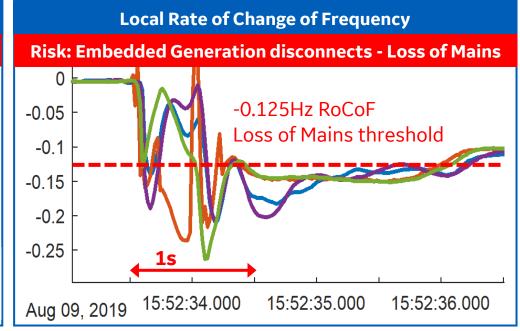
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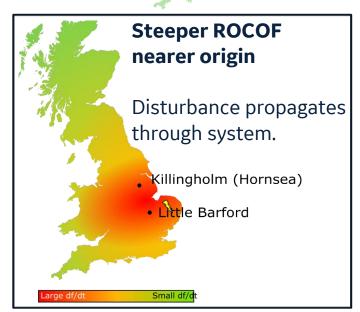
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#### **Effective Inertia**



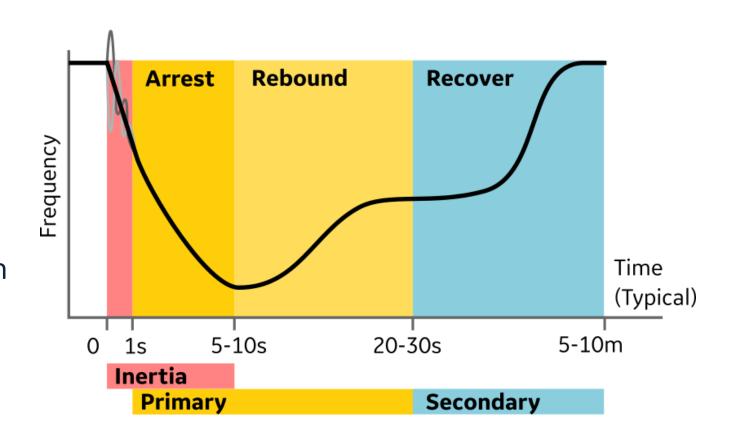
Relates **power imbalance** in a grid to the **rate of change of frequency** that immediately results

Ability of a grid to

resist changing speed due to a
generation/demand imbalance
or a fault

"Grid" can be whole interconnection or a coherent region

- a centre of inertia



### Effective Inertia: Why It Matters



#### Low Inertia means in a disturbance:

- Frequency falls faster & further before primary response kicks in
- Risk of Loss of Mains Disconnection
   Embedded Generation disconnects at high RoCoF
- Stability / Separation Risk
   Area angles move faster

   Fast response in wrong place can destabilize

#### Resulting in **Additional Costs:**

- Enhance Primary Response larger volume and/or faster delivery needed
- Procure Inertia
   Generation trading or dedicated 0 MW plant
- Tighten Constraints
   Largest single potential loss of generation
   Inter-region flows for transient stability

#### Effective Inertia: Sources



Physical Rotating Inertia at Transmission
Steam/Hydro/Gas turbines
Synchronous Condensers
Well Known

Load
Rotating machines
Other passive/active behaviour

Inverter-Based Resources
Solar/Wind Generation
HVDC Links
Energy Storage

"Residual" Less Known



Measurement & Forecasting of Effective Inertia is becoming critical to grid operation

#### Effective Inertia: Use Cases



### Constraining to Contain F & ROCOF

Contain system frequency within load shed limits by constraining largest infeed and/or minimum inertia

#### **Contain regional ROCOF**

by constraining largest area loss w.r.t. area inertia & area coupling

Avoid imposing onerous generator ROCOF requirements

#### Locational Fast Response

Accept reduced inertia by compensating loss without degrading stability of angles and risk of islanding

Area inertia helps relate system & area ROCOF to power imbalance, leading to proportional response

### **Islanding Management**

Improve islanding ride through capability by

- Identify acceptable area imbalance for islanding
- Incorporating **control** to improve island formation

Tune frequency control for island running → successful island operation Resynchronizing using acceptable ΔF

### Infrastructure Planning

Assess the needs for physical inertia (e.g. Sync Comp with flywheel) compared with the area's effective inertia.

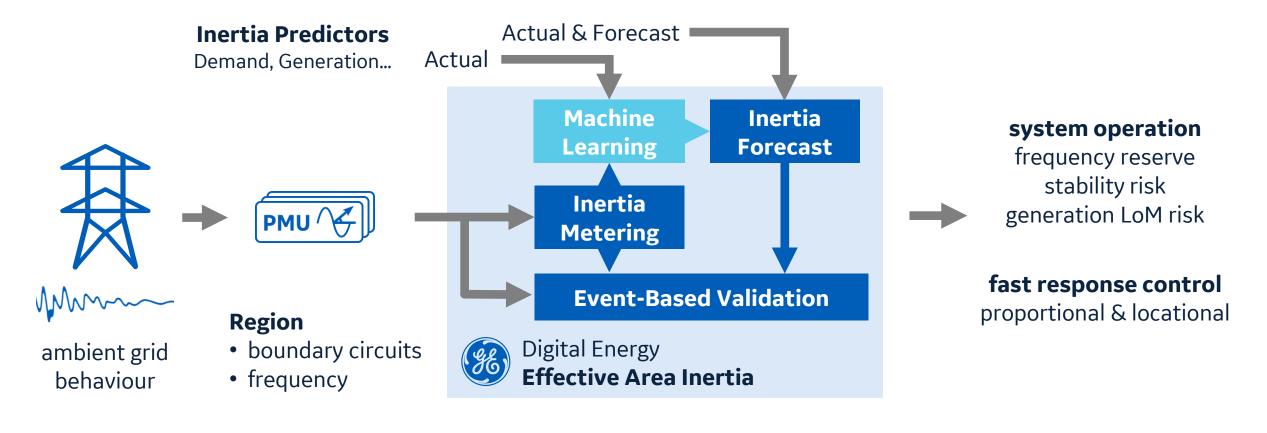
Avoid over-investment in capital assets while ensuring sufficient resources.



# GE Solution: Effective Area Inertia Metering, Forecast & Validation

### **Area Effective Inertia Metering, Forecast & Validation**





no forced excitation

standard WAMS measurements

scalable extensible secure
WAMS platform - premise or cloud

region + system inertia real-time, forecast & event



## Inertia Metering Using PMUs

### Area Effective Inertia Metering Using PMUs



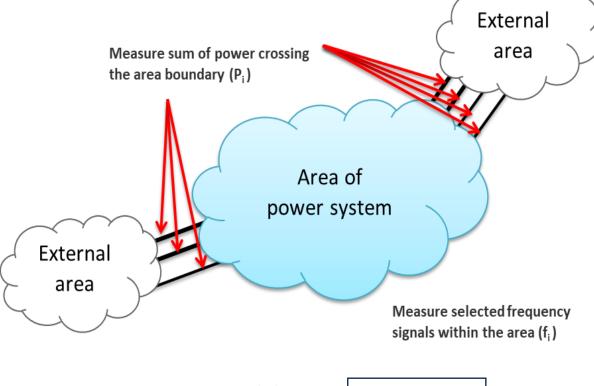
**Continuous, passive** metering of **Area Effective Inertia** using standard **PMU** measurements.

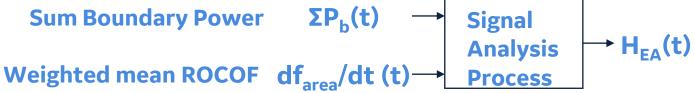
No deliberate excitation of system.

Only modest PMU measurements required:

- Area boundary power:
   V & I for transmission lines forming boundary
- Area frequency:

Few key measurements within area (e.g. 3-4) To give representative area frequency



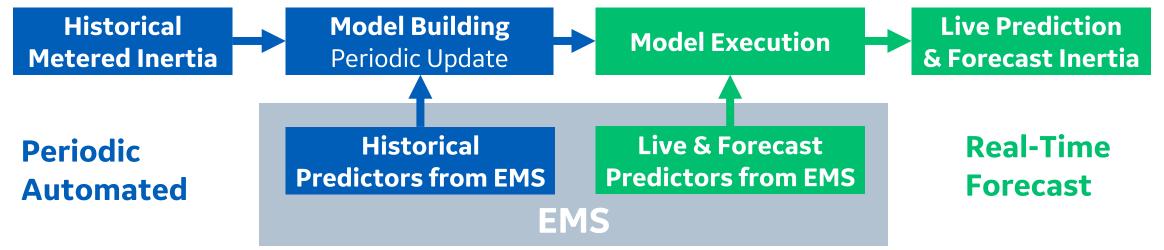




### Inertia Forecasting

### **Area Effective Inertia Forecasting**





Machine Learning model links inertia to predictor variables, on a per-area basis:

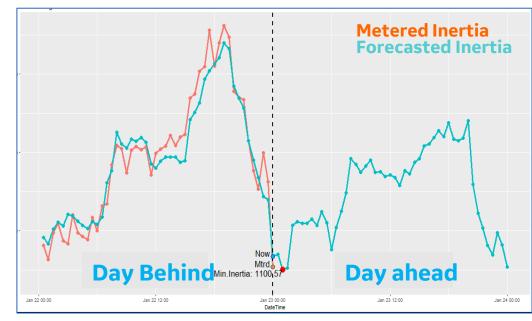
E.g. Demand, Synchronous Inertia, Wind, Solar

**Live Prediction** based on measured predictors

Backup & continuous validation with PMU-metered inertia

Forecast based on forecast predictors

Validated against metered and event inertia





### Offline Field Testing: SP Energy Networks

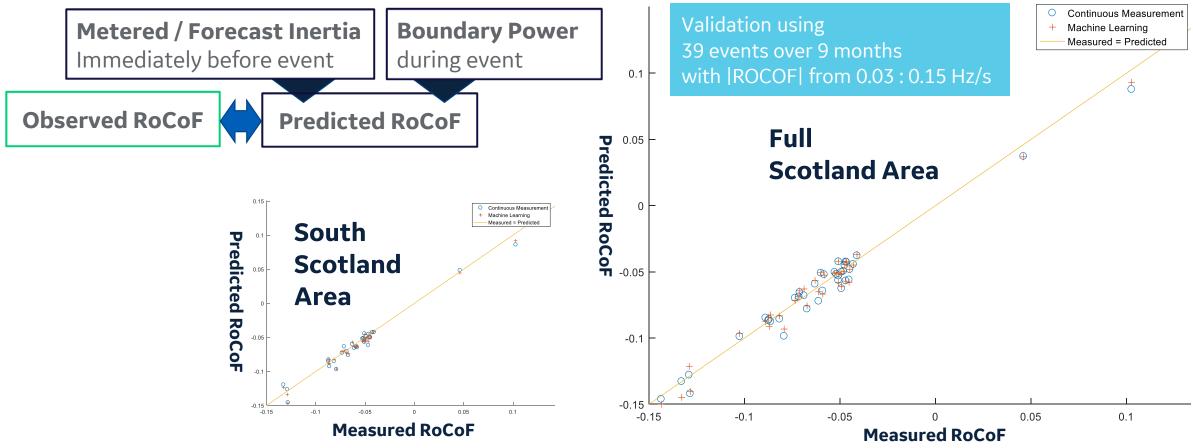
### Offline Field Testing: SP Energy Networks





Inertia Metering & Forecast values for South Scotland and Full Scotland Areas

Validated Inertia-Predicted RoCoF vs real system RoCoF behaviour during events





### Operational Deployment: National Grid ESO, GB

### National Grid ESO, GB: Operational Deployment



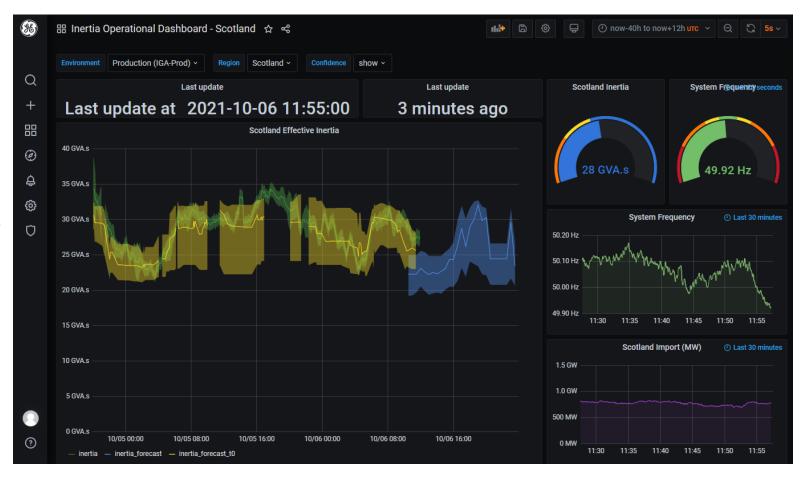


### Inertia Metering online for > 7months

- Continuous, real-time visibility of inertia in Scotland
- PMU connections under way to cover remaining regions of GB

### Inertia Forecasting online for >14 days

- Continuous real-time Forecast of inertia in Scotland
- Live prediction and Look-ahead Forecast



### National Grid ESO, GB: Operational Experience



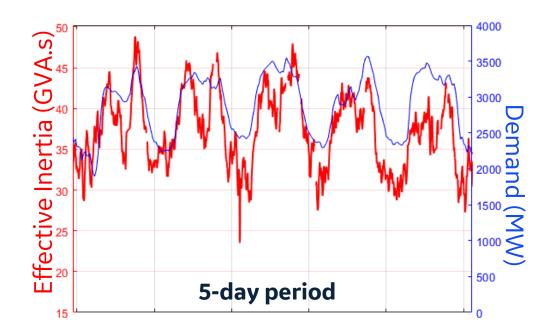


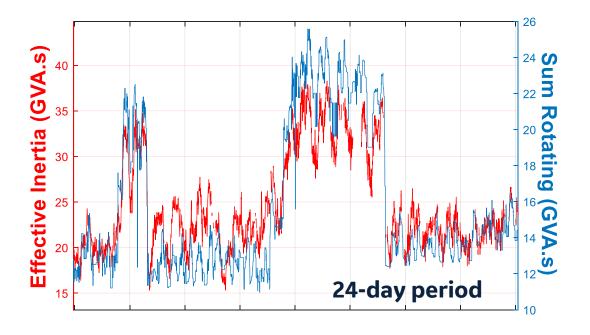
#### **Metered Inertia:**

Results match expectations: consistent with variations in demand & known rotating inertia

Example:
Daily correlation with **Demand** 

Example:
Long term **correlation** with known **Rotating Inertia** 





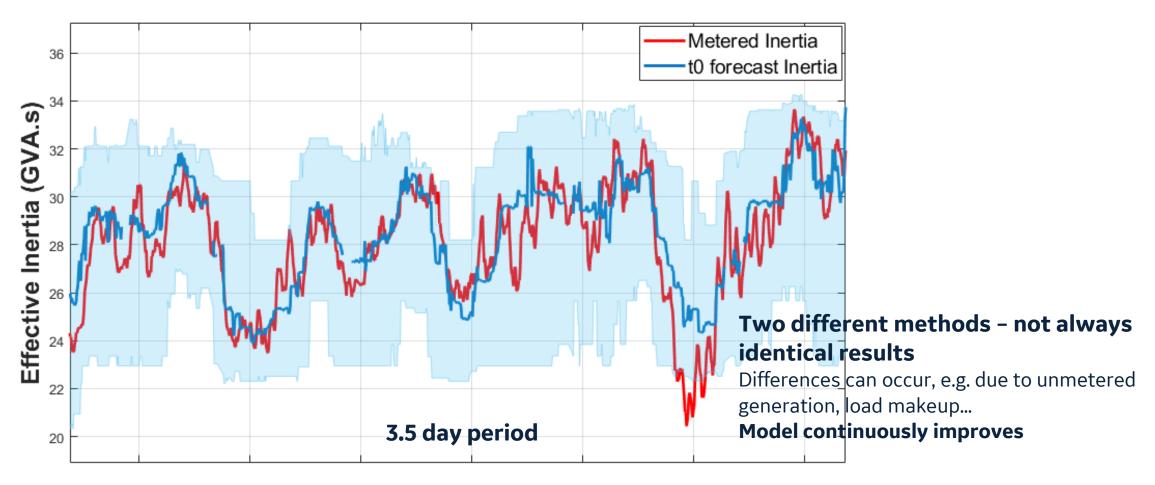
Regular automated validation against real system behaviour during events.

### National Grid ESO, GB: Operational Experience





Live Inertia Prediction: backup & continuous sanity-check with PMU-metered inertia



Regular automated validation against real system behaviour during events.

### National Grid ESO, GB: Operational Experience





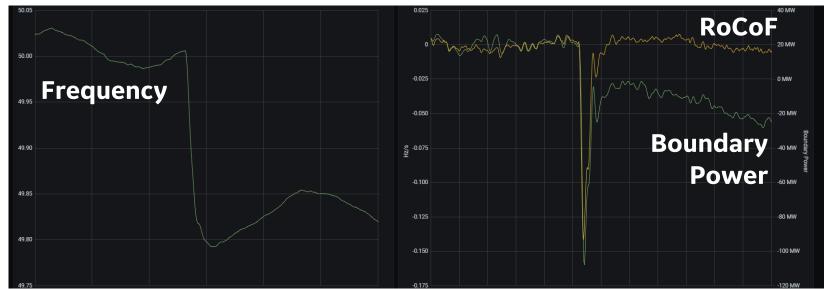
#### **Automated event detection & inertia validation:**

On-going validation against real system behaviour during events



#### Example Event

Inertia (GVA.s)	23
ΔP (MW)	-130
<b>Predicted ROCOF</b> (Hz/s)	-0.14
<b>Observed ROCOF</b> (Hz/s)	-0.14
ROCOF Prediction Error (%)	1





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### Conclusions

#### **Conclusions**





- 1. Inertia is a regionally distributed parameter affecting local RoCoF and stability, not just system frequency
- 2. Effective Inertia covers all contributors to the P-RoCoF relationship, not just physical rotating transmission generation.
- **3. PMU-based metering** of Effective Area Inertia is **passive**, uses standard PMU measurements, and is **in operation now**.
  - Informs secure system operation, planning & analysis.

    Can feed **wide-area control** driven fast frequency response for islanding avoidance / ride-through.
- 4. Machine Learning yields forecast of inertia in operation now Insight into system inertia influencers
  Backup and real-time validation of inertia metering
  Look-ahead forecast (e.g. day-ahead)

