

# Evaluation of Probing Signals for Implementing Moving Horizon Inertia Estimation in Microgrids



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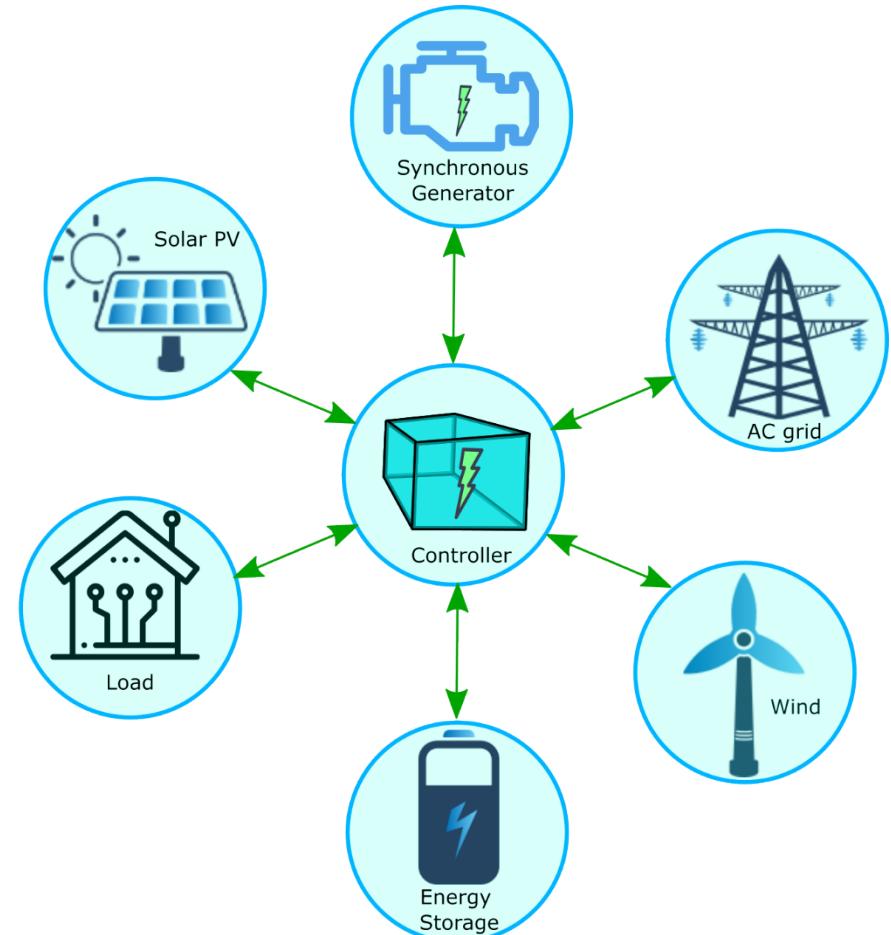
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# Inverter based-grid and Parameter Estimation

- increase in converter-based renewable energy sources
  - low and time-varying power system inertia ( $M$ )
  - susceptible to changes in load
  - large rate of change of frequency (ROCOF)
- accurate estimation of  $M$  and damping coefficient ( $D$ ) required
  - proper grid control and dispatch of energy storage systems
  - fast-frequency support strategies
  - support ancillary services
- moving horizon estimation (MHE) estimates online plant states and parameters
  - based on phase locked loop measurements (PLL)
- efficacy of MHE depends on excitation signal



# Objective

- evaluate performance of MHE for inertia estimation using different excitation signals
  - MHE proposed for online estimation

# Moving Horizon Estimation

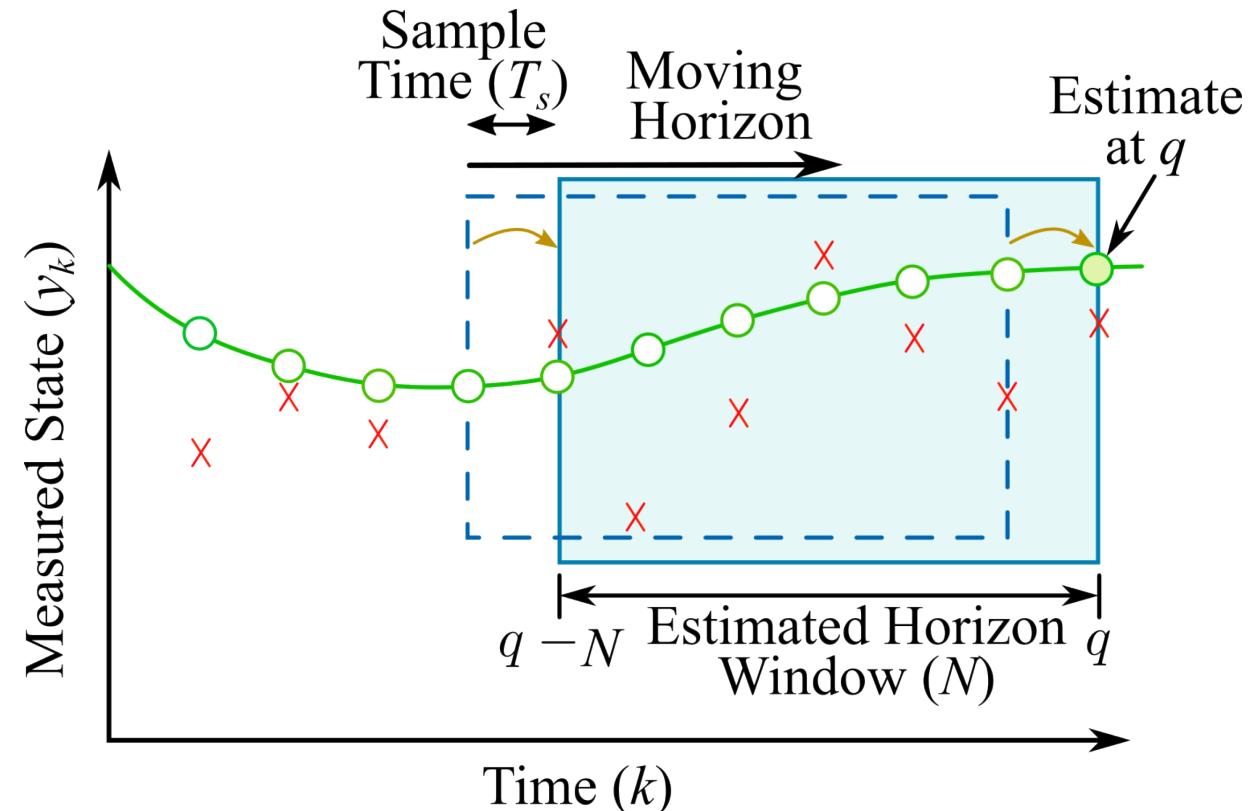
- finite horizon optimization-based estimation process
- infer state variables and parameters of system from measurements of system

where,

$N$  = horizon length

$T_s$  = sampling time of MHE

$y_k$  = measured states at discrete time instant  $k$

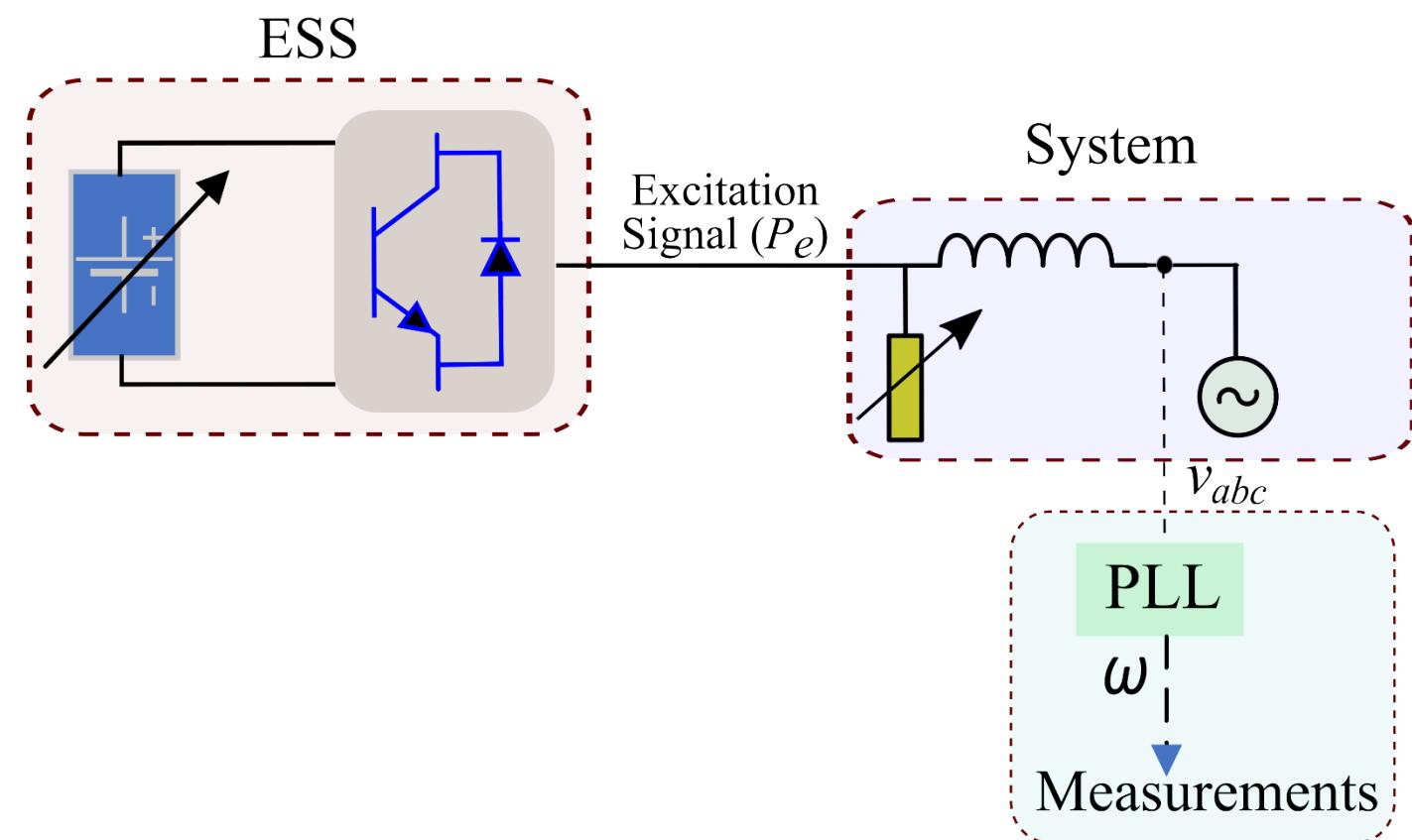


Inputs : measurements of system

Outputs : state and parameters estimates

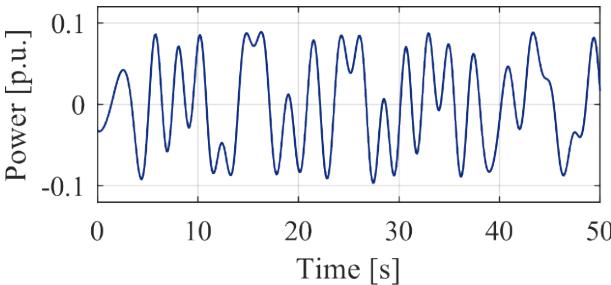
# System Perturbation using Probing Signals

- energy storage system (ESS) used to inject probing signal
- probing signal perturb frequency of system
  - online measurements of frequency using PLL
  - ROCOF measured from frequency perturbation

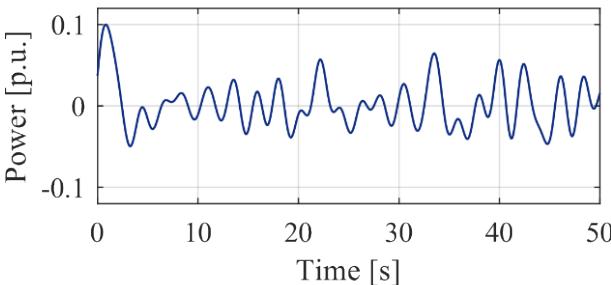


# Excitation Signals : Time Domain Design

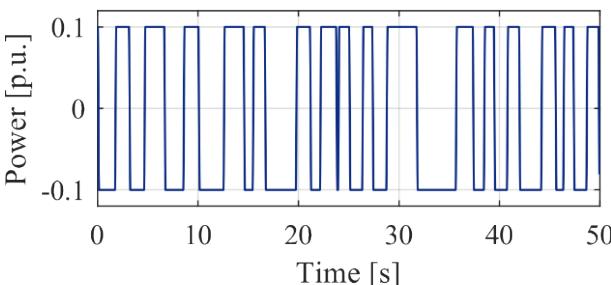
**Multisine wave signal**



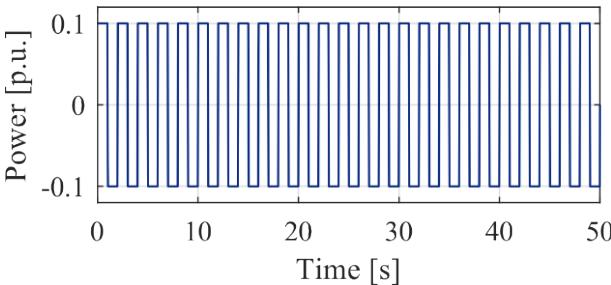
**FWGN signal**



**PRBS signal**



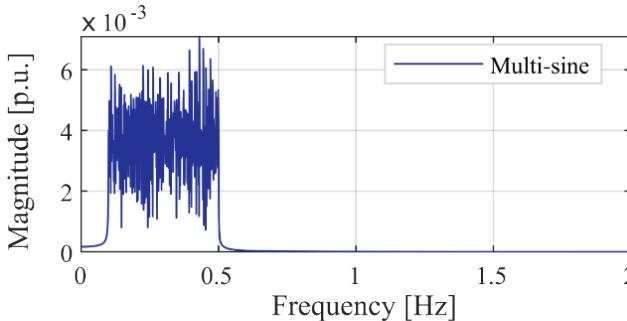
**Square signal**



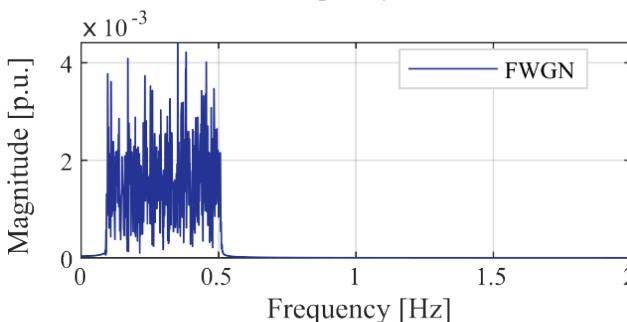
- design and evaluation of excitation signal to give accurate estimates
- minimize impact on operation of power system and system security
- minimal value of crest factor ( $C_r$ )
- avoid sharp transitions and high ramp rates
- small peak amplitude

# Excitation Signals : Frequency Spectral Energy

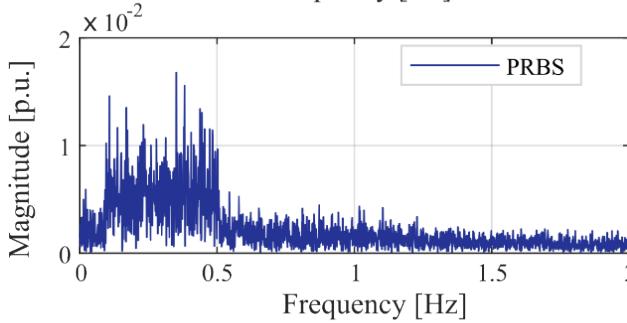
**Multisine wave signal**



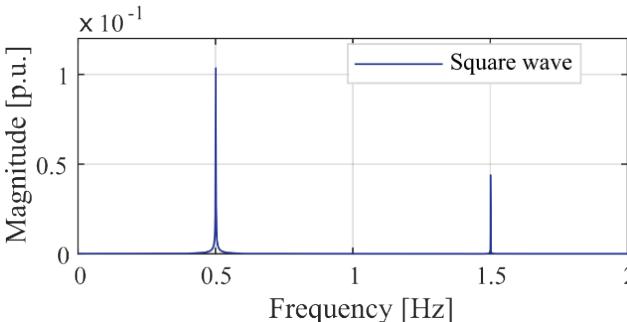
**FWGN signal**



**PRBS signal**



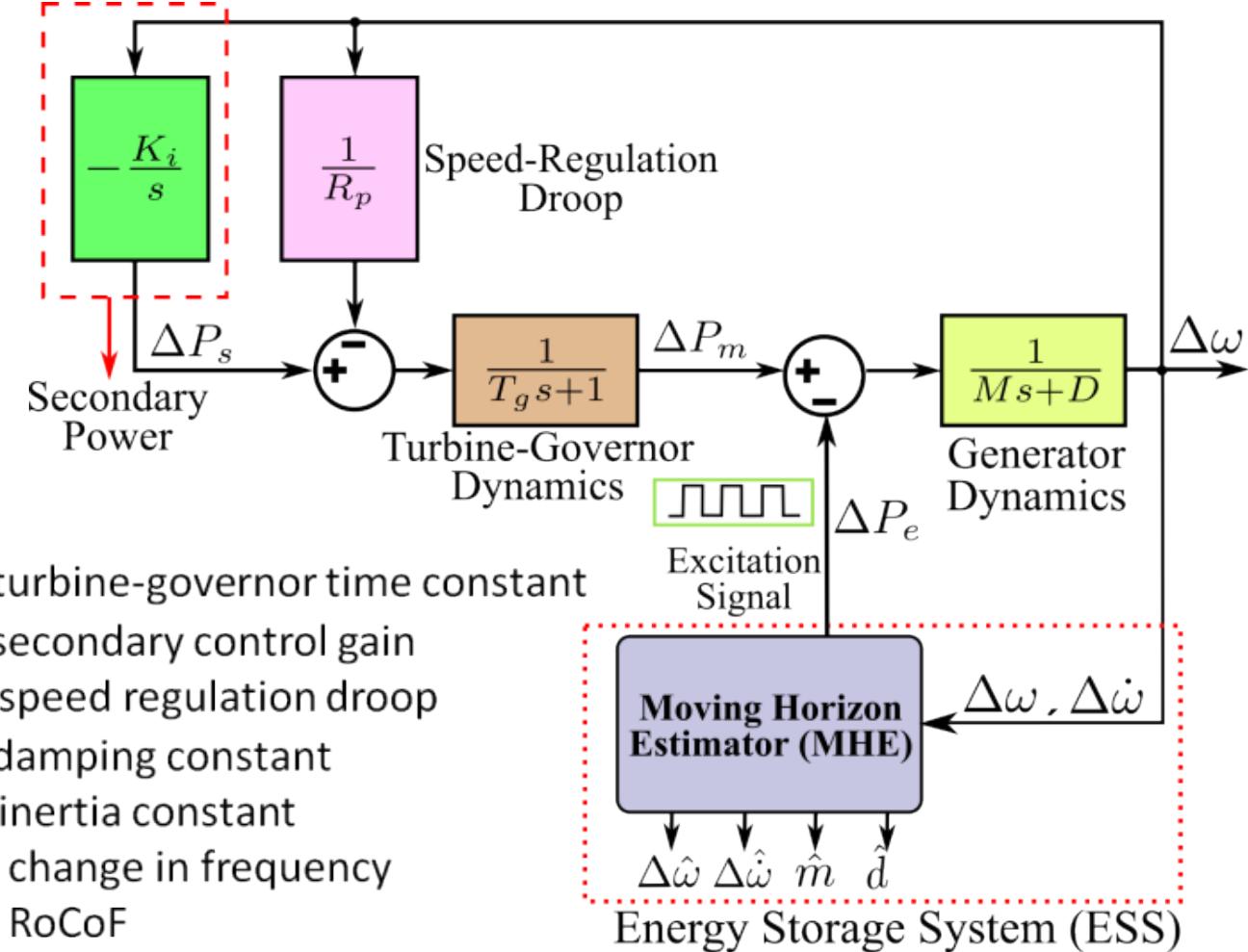
**Square signal**



- frequency band corresponds to inertial constant range
  - 2 – 10 s
- square wave and PRBS have similar time domain shape and spectral energy
- percentage energy concentration in frequency band
  - multisine wave signal : 98%
  - filtered white gaussian noise (FWGN) signal : 97%
  - pseudo random binary signal (PRBS) : 38%
  - ramp limited square wave : 23%

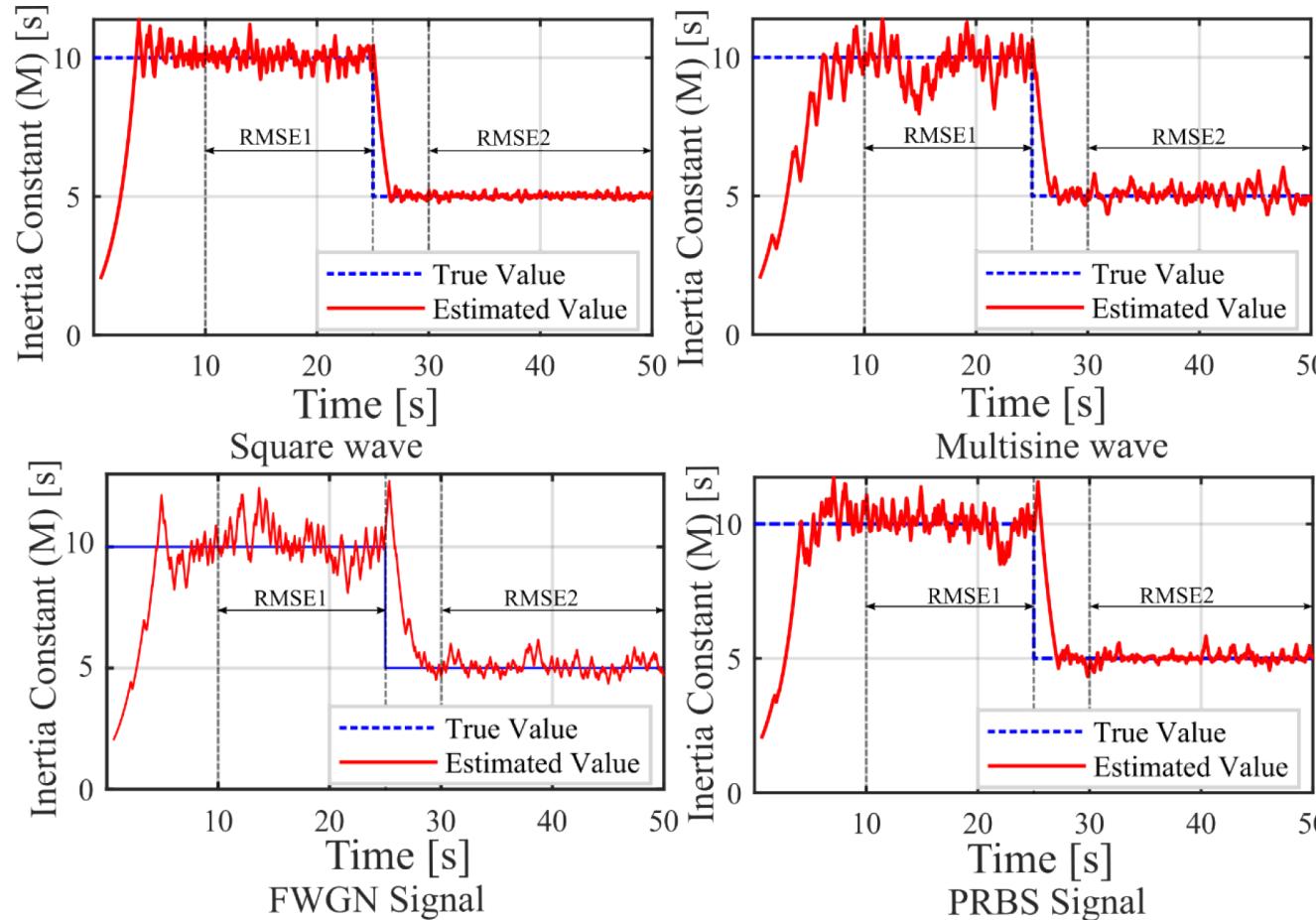
# Simulation Setup: MHE and Parameter Estimation

- white Gaussian noise added
- isolated power system model
- state and parameter estimation
- true value of inertia set to 10s which changes to 5s after 25s
- damping constant is 1.5 throughout simulation
- evaluate estimation accuracy of designed probing signals



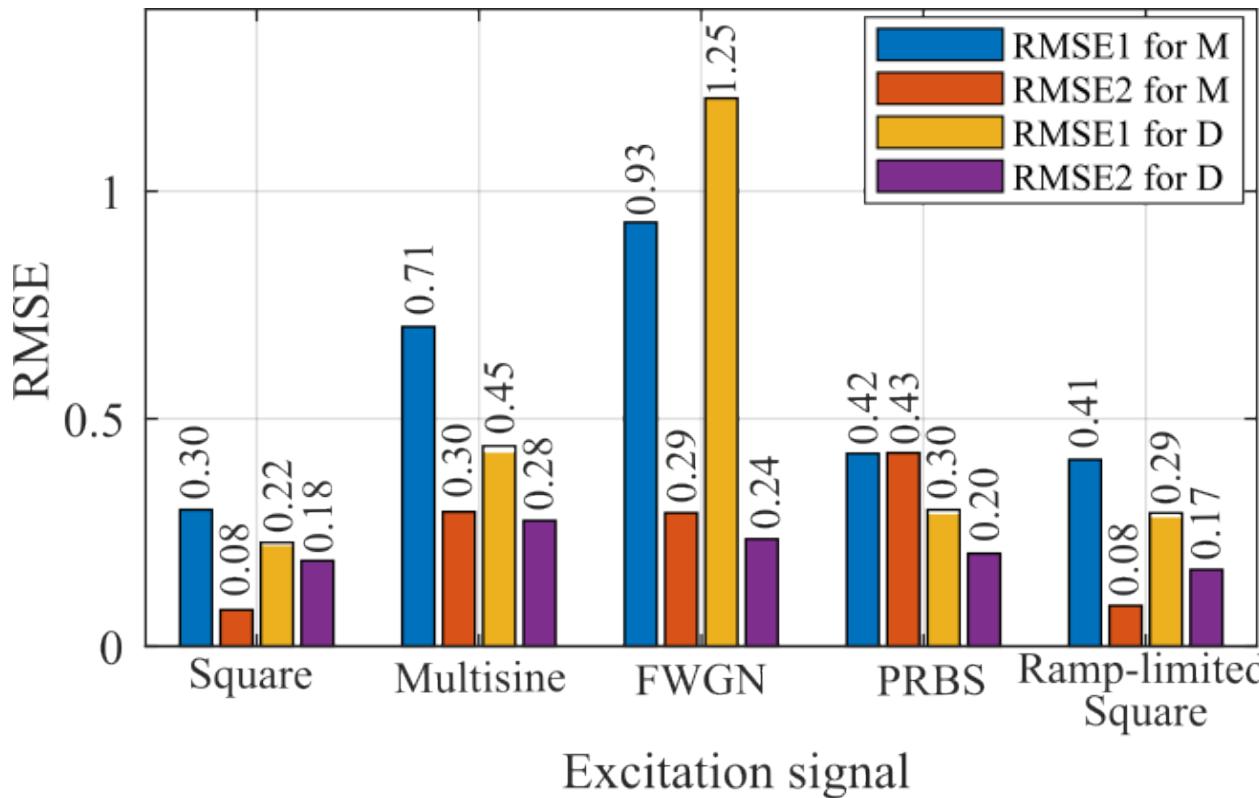
states:  $\Delta\omega, \Delta\dot{\omega}$   
parameters:  $M, D$

# Results on Inertia Estimation



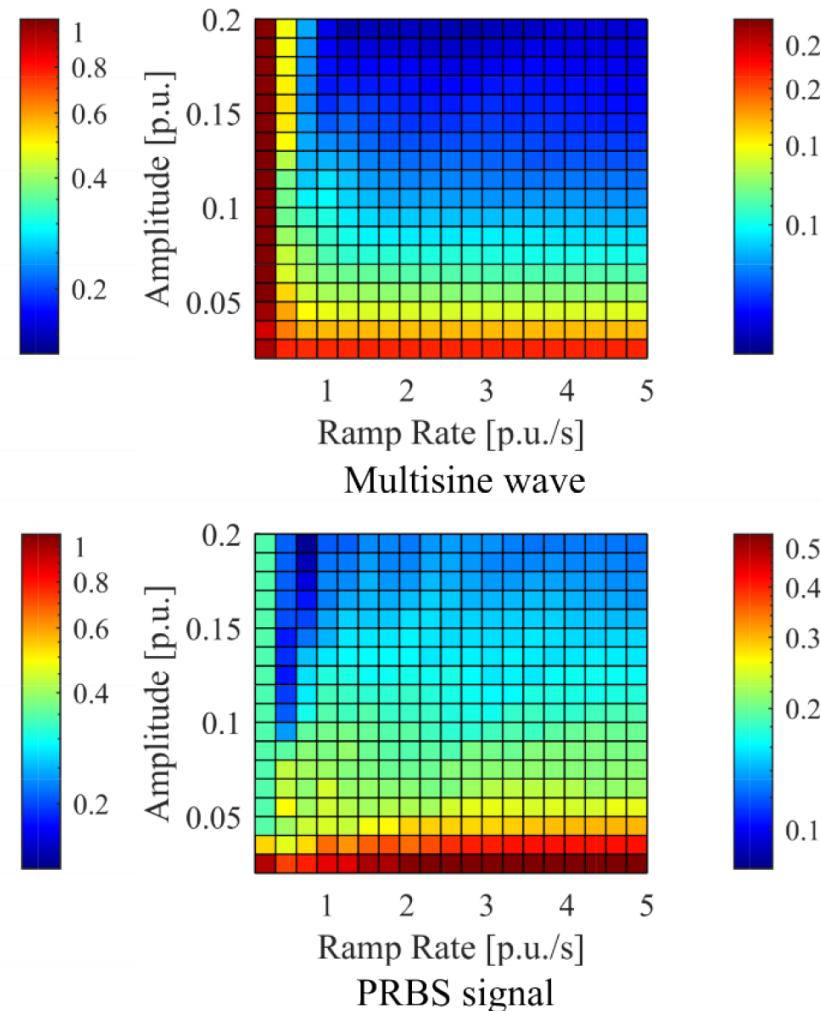
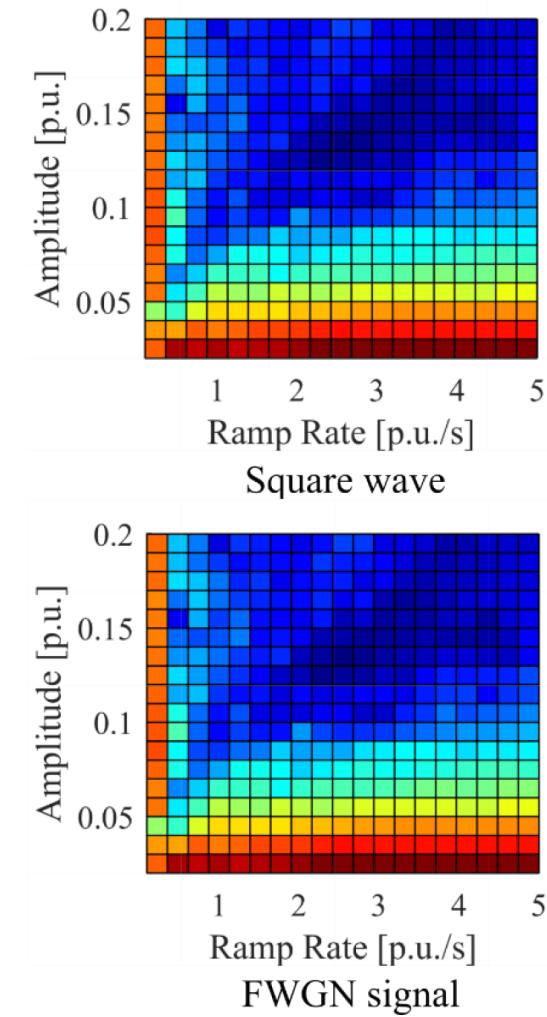
- true value of inertia set to 10s which changes to 5s after 25s
- damping constant is 1.5 throughout simulation
- MHE estimates true value of  $M$  and  $D$  accurately in 3-4 s
- accuracy of estimation is different for each probing signal

# Performance Metrics : Result Analysis



- stochastic, non-periodic signals yielded poor estimation
  - FWGN and PRBS signal
- square wave give better estimation than PRBS
  - square wave : higher frequency components
- FWGN has high  $C_r$  than multisine
- higher error for  $M = 10 \text{ s}$  than  $M = 5 \text{ s}$
- when  $M \downarrow$ , change in frequency and ROCOF  $\uparrow$

# Performance Metrics : Result Analysis



- square wave signal shows highly accurate estimation
- lower (i.e., blue) is better for variations in RMSE
- higher amplitude excitation signals produced better estimation
  - higher SNR
- accuracy of estimation decreases for amplitude less than 0.05 p.u.
- ramp-limited square waves still showed high accuracy
  - peak amplitude was not affected by limiting the ramp rate

# Conclusions

- higher the amplitude of excitation signal produce better estimation results
  - ↑ in signal to noise ratio
- FWGN with higher  $C_r$  shows RMSE of 0.93
- square waves shows higher accuracy with minimum RMSE of 0.3
  - may be limited to preserve lifetime of ESS
  - reduces the impact on power system operation

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