



# Identification of hydro power frequency containment reserve dynamics using PMUs

Sigurd Hofsmo Jakobsen

Norwegian university of technology and science Department of electrical  
engineering

October 30, 2018

# Outline



About me

Background

Previous work using PMUs

Validation of the approach

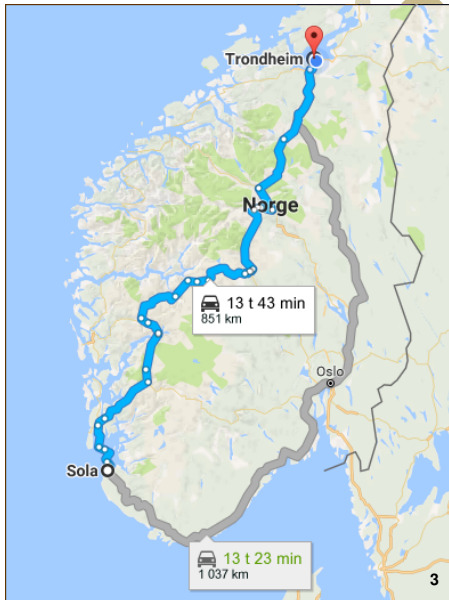
Simulation results

Results from a real power plant

Conclusions and further work

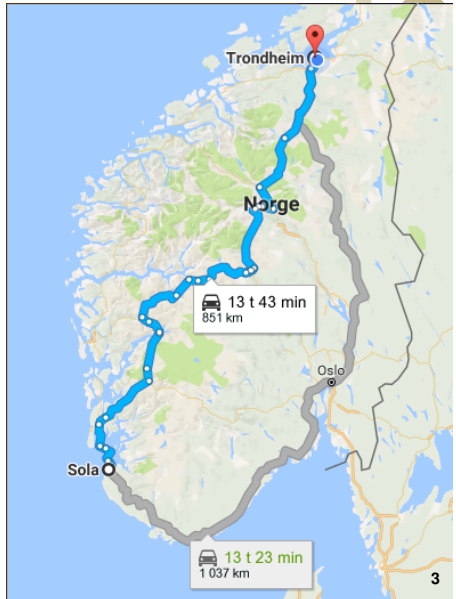
# About me

- From Sola



# About me

- From Sola
- Studied and works in Trondheim



# About me

- From Sola
- Studied and works in Trondheim
- Worked as a research engineer from 2013-2015 for SINTEF Energy Research



# About me

- From Sola
- Studied and works in Trondheim
- Worked as a research engineer from 2013-2015 for SINTEF Energy Research
- Currently PhD student at NTNU



# About me

- From Sola
- Studied and works in Trondheim
- Worked as a research engineer from 2013-2015 for SINTEF Energy Research
- Currently PhD student at NTNU
- 10% position at SINTEF Energy Research



# Outline



About me

Background

Previous work using PMUs

Validation of the approach

Simulation results

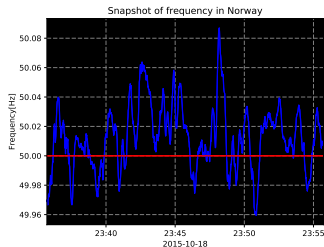
Results from a real power plant

Conclusions and further work



# Frequency quality in the Nordics

- From 2008 the time the frequency has been outside its allowed band has increased
- The performance of hydro turbine governors play an important role



# Challenges in operation

- Towards 100% renewable electricity generation
  - Larger variability
  - More uncertainty
  - Increasing complexity

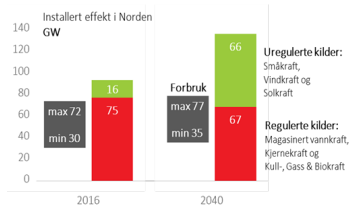


Figure: Present and future energy mix[Statnett]

# Challenges in operation

- Towards 100% renewable electricity generation
  - Larger variability
  - More uncertainty
  - Increasing complexity
- More dynamics

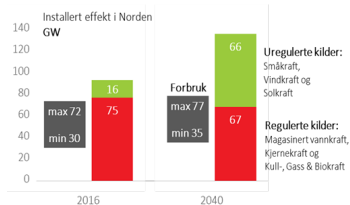


Figure: Present and future energy mix[Statnett]

# Challenges in operation

- Towards 100% renewable electricity generation
  - Larger variability
  - More uncertainty
  - Increasing complexity
- More dynamics
- Less time for actions

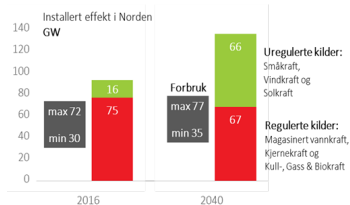


Figure: Present and future energy mix[Statnett]

# Challenges in operation

- Towards 100% renewable electricity generation
  - Larger variability
  - More uncertainty
  - Increasing complexity
- More dynamics
- Less time for actions
- **Hydropower** is the main resource for balancing

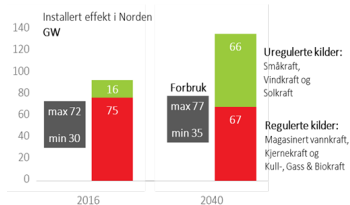
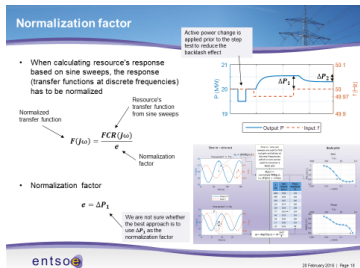


Figure: Present and future energy mix[Statnett]

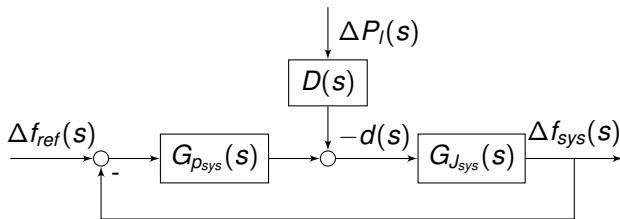
# New requirements on FCR due to frequency quality

- Nordic TSOs are developing new requirements on FCR
- This includes offline testing and verification of performance



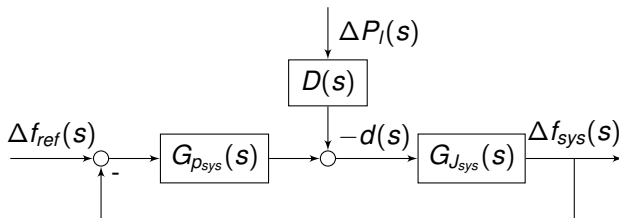
# Theoretical background for new requirements

- Aggregated system model:



# Theoretical background for new requirements

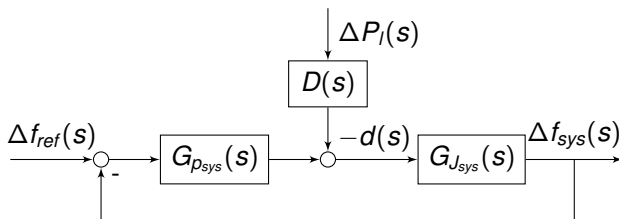
- Aggregated system model:
  - $G_{p_{sys}}(s)$ : Aggregated model of FCR





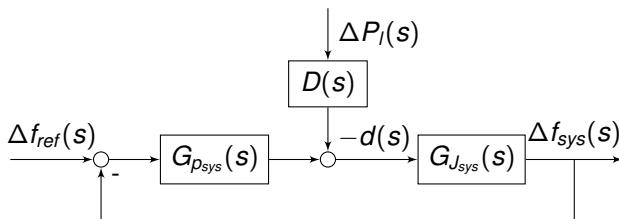
# Theoretical background for new requirements

- Aggregated system model:
  - $G_{p_{sys}}(s)$ : Aggregated model of FCR
  - $G_{J_{sys}}(s)$ : Aggregated model of swing dynamics



# Theoretical background for new requirements

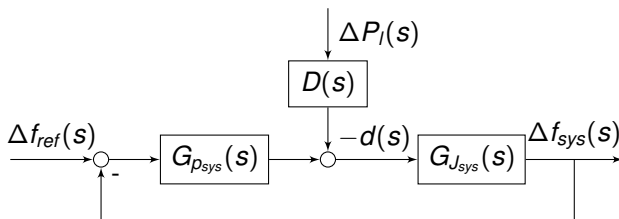
- Aggregated system model:
  - $G_{p_{sys}}(s)$ : Aggregated model of FCR
  - $G_{J_{sys}}(s)$ : Aggregated model of swing dynamics
  - $\Delta P_l(s)$ : Aggregated load changes



# Theoretical background for new requirements

- Aggregated system model:
  - $G_{p_{sys}}(s)$ : Aggregated model of FCR
  - $G_{J_{sys}}(s)$ : Aggregated model of swing dynamics
  - $\Delta P_l(s)$ : Aggregated load changes
- Stability requirement stated in terms of the system's sensitivity function

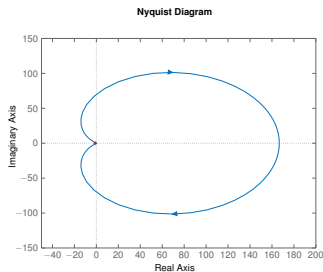
$$S_{sys}(s) = \frac{1}{1 + G_{p_{sys}}(s)G_{J_{sys}}(s)} \quad (1)$$



# Stability using Nyquist

- Stability can be checked using:

$$L_{sys}(s) = G_{p_{sys}}(s)G_{J_{sys}}(s) \quad (2)$$



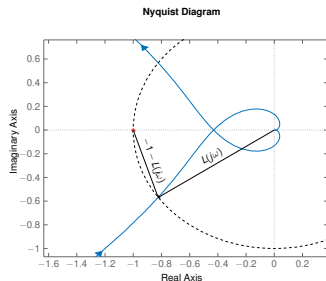
# Stability using Nyquist

- Stability can be checked using:

$$L_{sys}(s) = G_{p_{sys}}(s)G_{J_{sys}}(s) \quad (2)$$

- Stability margin given by:

$$Ms = \min | -1 - L_{sys}(j\omega) | \quad (3)$$



# Stability using Nyquist

- Stability can be checked using:

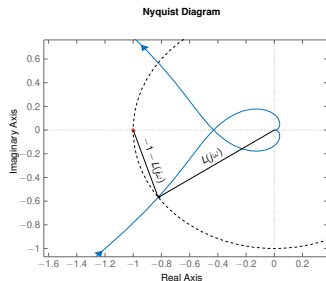
$$L_{sys}(s) = G_{p_{sys}}(s)G_{J_{sys}}(s) \quad (2)$$

- Stability margin given by:

$$Ms = \min | -1 - L_{sys}(j\omega) | \quad (3)$$

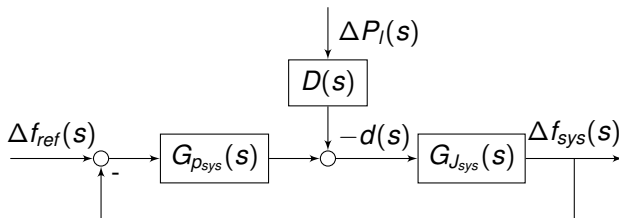
- Notice that

$$\min | -1 - L_{sys}(j\omega) | = \max | S_{sys}(j\omega) | \quad (4)$$



## Draft requirements for performance

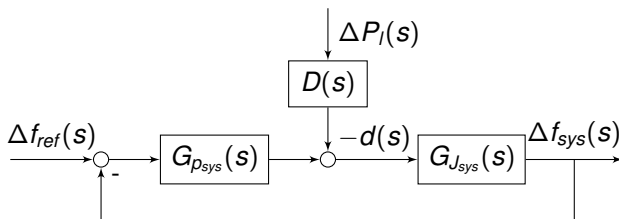
- For the performance we want to limit the change in frequency.



## Draft requirements for performance

- For the performance we want to limit the change in frequency.
- The change in frequency is given by:

$$\Delta f_{sys}(s) = -2\pi G_{J_{sys}}(s) S_{sys}(s) d(s) = 2\pi G_{1_{sys}}(s) d(s) \quad (5)$$





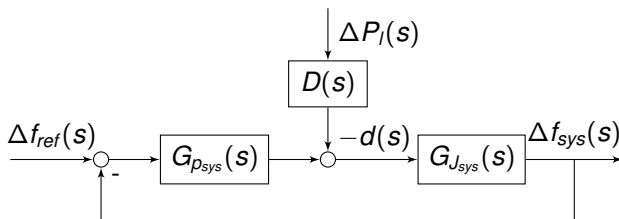
## Draft requirements for performance

- For the performance we want to limit the change in frequency.
- The change in frequency is given by:

$$\Delta f_{sys}(s) = -2\pi G_{J_{sys}}(s) S_{sys}(s) d(s) = 2\pi G_{1_{sys}}(s) d(s) \quad (5)$$

- We can use this for defining the performance requirements:

$$|2\pi G_{1_{sys}}(j\omega)|^2 \phi_d(\omega) < \phi_{\Delta f}(\omega) = 0.1 \quad (6)$$



## Draft requirements for power plant



1. Measure a plant's response to ten sine injections

## Draft requirements for power plant



1. Measure a plant's response to ten sine injections
2. Estimate  $G_p^{(p.u.)}(s)$  for the plant based on the sine injections

## Draft requirements for power plant



1. Measure a plant's response to ten sine injections
2. Estimate  $G_p^{(p.u.)}(s)$  for the plant based on the sine injections
3. Use  $G_p^{(p.u.)}(s)$  together with  $G_{J_{sys}}^{(p.u.)}(s)$  to check.

$$|S(j\omega)| < \frac{1}{M_s} \quad (7)$$

and

$$|2\pi G_1(j\omega)|^2 \phi_d(\omega) < 0.1 \quad (8)$$

## Drawbacks with the draft requirements



- One has to disconnect the plant to inject the sine waves.
- Injecting 10 sine waves take a lot of time.
- They assume the same swing dynamics for all plants.

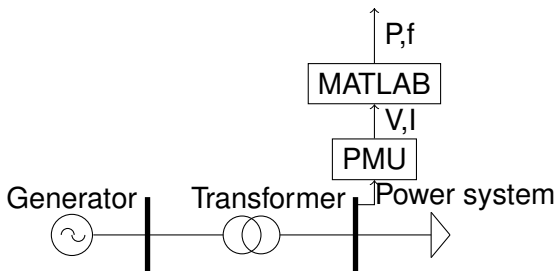
## Research question

- Can the draft requirements be tested using PMU measurements from normal operation?

$$|S(j\omega)| < \frac{1}{M_s} \quad (9)$$

and

$$|2\pi G_1(j\omega)|^2 \phi_d(\omega) < 0.1 \quad (10)$$



# Outline



About me

Background

Previous work using PMUs

Validation of the approach

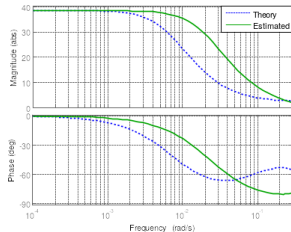
Simulation results

Results from a real power plant

Conclusions and further work

## Previous work at NTNU

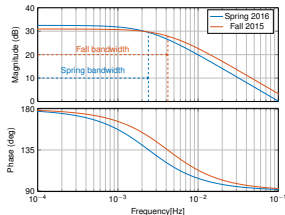
- A transfer function was identified from the electrical frequency to the electrical power under normal operation using the ARX model structure.





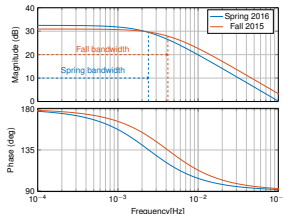
## Previous work at NTNU

- A transfer function was identified from the electrical frequency to the electrical power under normal operation using the ARX model structure.
- A transfer function was identified from the electrical frequency to the electrical power under normal operation using vector fitting.



## Previous work at NTNU

- A transfer function was identified from the electrical frequency to the electrical power under normal operation using the ARX model structure.
- A transfer function was identified from the electrical frequency to the electrical power under normal operation using vector fitting.
- There are also papers in the literature using other methods for online identification, however, mostly relying on data from disturbance recordings.



# Outline



About me

Background

Previous work using PMUs

**Validation of the approach**

Simulation results

Results from a real power plant

Conclusions and further work

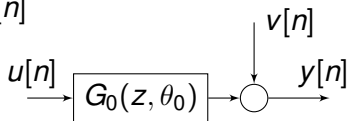
# System identification basic

- Assume that a data set  $Z^N = \{u[n], y[n] | n = 1 \dots N\}$  has been collected.
- The dataset  $Z^N$  is assumed generated by

$$\mathcal{S} : y[n] = G_1(z, \theta_1)u[n] + H_1(z, \theta_1)e[n] \quad (11)$$

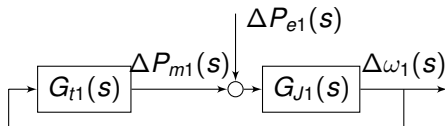
- Using the data set  $Z^N$  we want to find the parameter vector  $\theta^N$  minimizing

$$\hat{\theta}_N = \arg \min_{\theta} \frac{1}{N} \sum_{n=1}^N \epsilon^2(n, \theta) \quad (12)$$



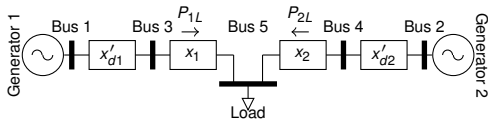
## Modeling used for the validation

- The system we want to identify



# Modeling used for the validation

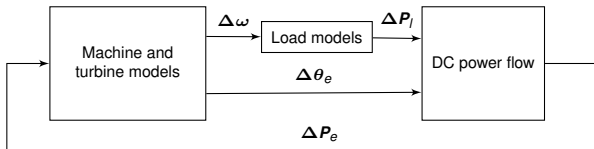
- The system we want to identify
- We use a small power system



# Modeling used for the validation

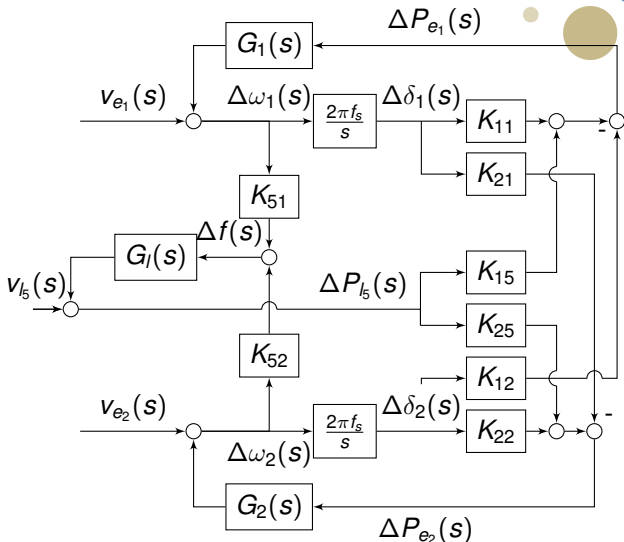


- The system we want to identify
- We use a small power system
- We use a dc power flow



## Modeling used for the validation

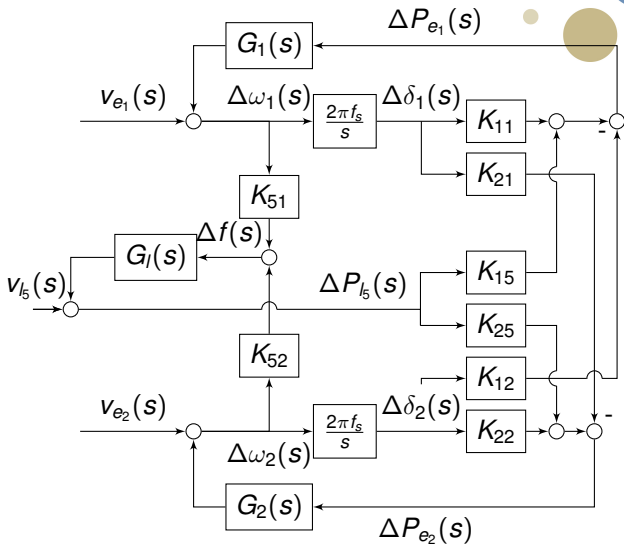
- The system we want to identify
- We use a small power system
- We use a dc power flow
- This results in the following block diagram





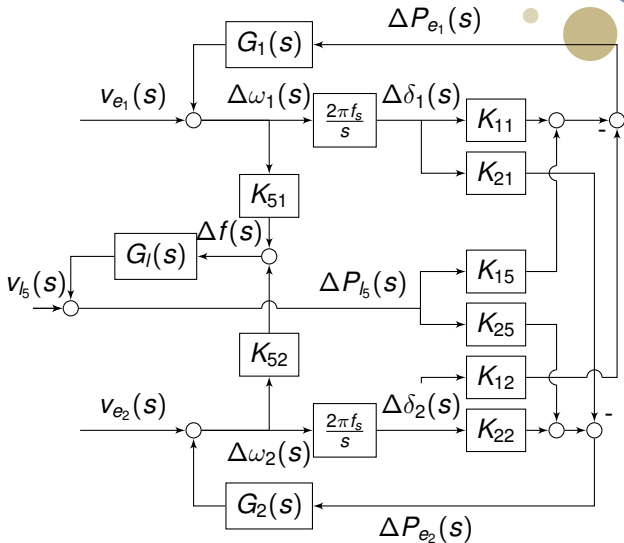
## Conclusion from the identification analysis

- We can identify a consistent estimate of  $G_1(s)$



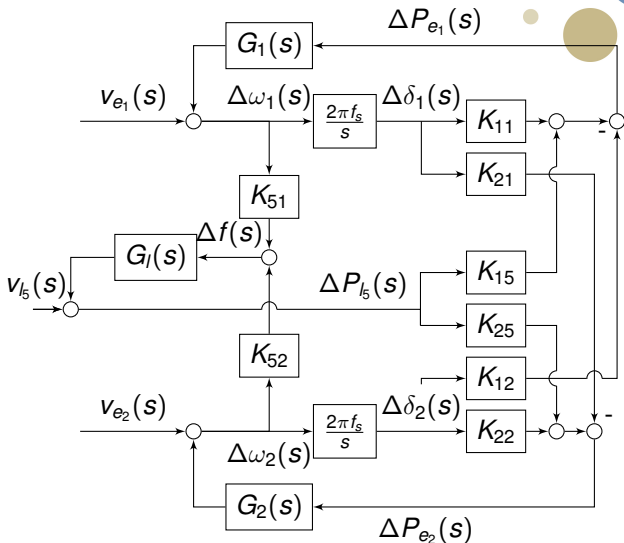
# Conclusion from the identification analysis

- We can identify a consistent estimate of  $G_1(s)$ 
  - If  $v_{l5}(s)$  excites the system sufficiently,



# Conclusion from the identification analysis

- We can identify a consistent estimate of  $G_1(s)$ 
  - If  $v_{l5}(s)$  excites the system sufficiently,
  - and there is a delay in either  $G_1(s)$  of the transfer function from  $\Delta\omega_1(s)$  to  $\Delta P_{e1}(s)$ .



# Outline



About me

Background

Previous work using PMUs

Validation of the approach

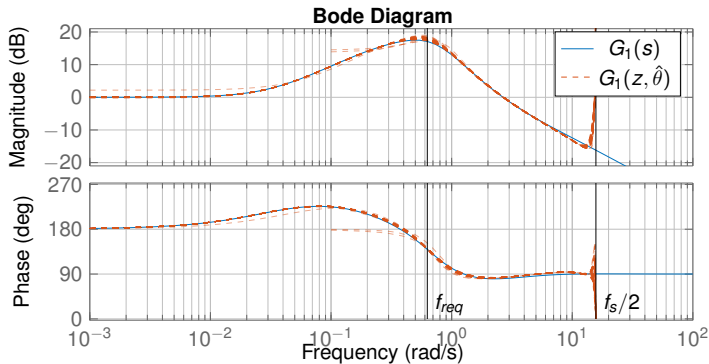
**Simulation results**

Results from a real power plant

Conclusions and further work

## Example of identifying $G_1(s)$ in Simulink

- The simple power system presented was implemented in Simulink.



## The identification experiment in the draft requirements



- In the draft requirements they require the power plant owners to replace the input to the governor with their own signal.

## The identification experiment in the draft requirements



- In the draft requirements they require the power plant owners to replace the input to the governor with their own signal.
- They then identify the transfer function from the input to the governor to the electrical power of the generator.

$$G_{req}(s) = -\frac{G_p(s)G_J(s)T(s)}{1 + G_J(s)T(s)} \quad (13)$$

## The identification experiment in the draft requirements



- In the draft requirements they require the power plant owners to replace the input to the governor with their own signal.
- They then identify the transfer function from the input to the governor to the electrical power of the generator.

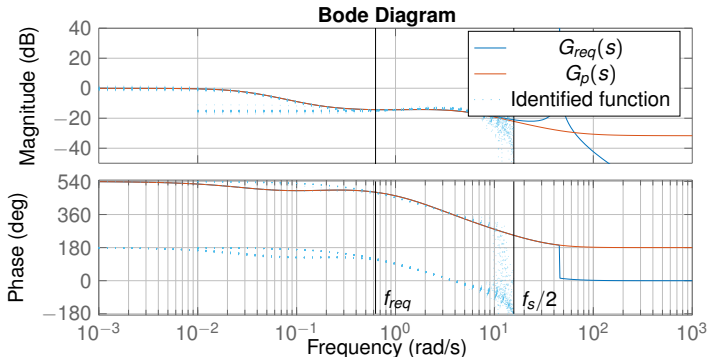
$$G_{req}(s) = -\frac{G_p(s)G_J(s)T(s)}{1 + G_J(s)T(s)} \quad (13)$$

- This is not  $G_p(s)$



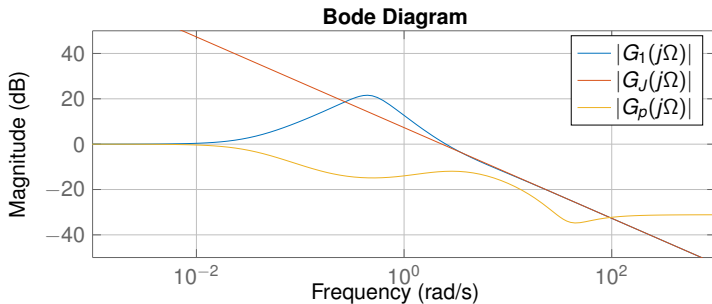
## Example of identifying $G_{req}(s)$ in Simulink

- The transfer function specified in the draft requirements were also estimated in the simulations.



# Estimating the swing dynamics of a power plant

- To find  $S(s)$  we need an estimate of  $G_J(s)$ .

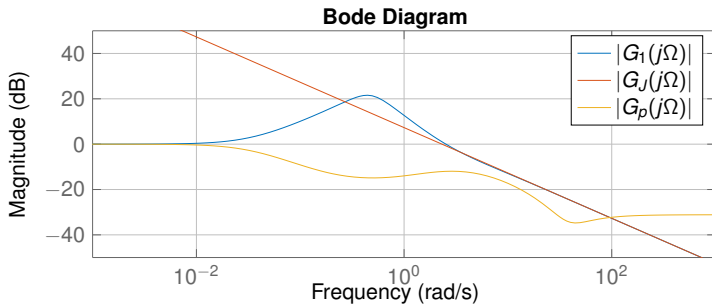


# Estimating the swing dynamics of a power plant

- To find  $S(s)$  we need an estimate of  $G_J(s)$ .

- 

$$H \approx \frac{\Omega_2 - \Omega_1}{2\Omega_1\Omega_2(|G_1(j\Omega_1)| - |G_1(j\Omega_2)|)} \quad (14)$$

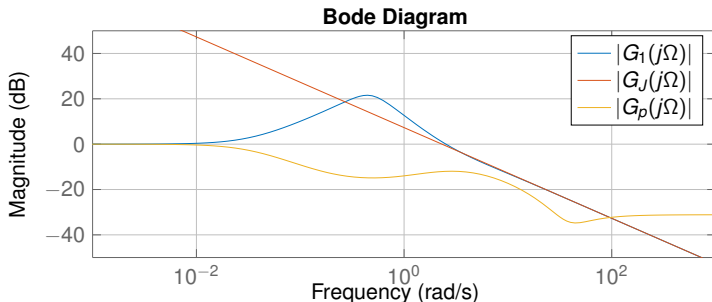


# Estimating the swing dynamics of a power plant

- To find  $S(s)$  we need an estimate of  $G_J(s)$ .

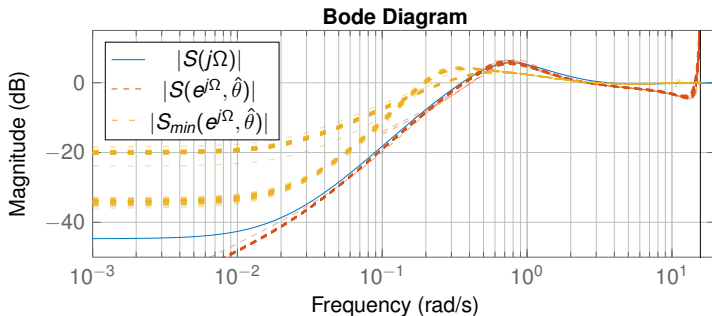
$$H \approx \frac{\Omega_2 - \Omega_1}{2\Omega_1\Omega_2(|G_1(j\Omega_1)| - |G_1(j\Omega_2)|)} \quad (14)$$

$$S(s) \approx 2HsG_1(s) \quad (15)$$



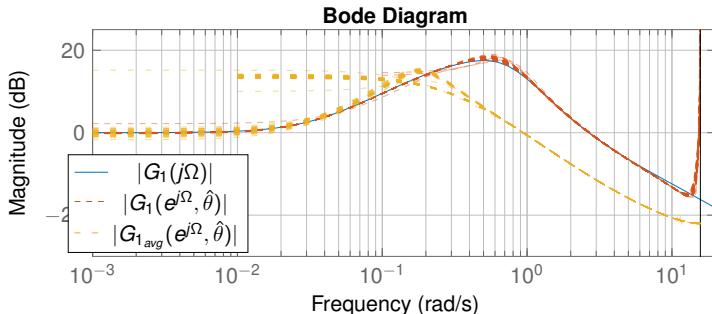
# Comparison of estimated sensitivity functions

$$G_{sys}(s) = \frac{600MW}{0.1Hz} \frac{f_0}{S_{sys}} \frac{1}{2H_{sys}s + K_{d_{sys}} * f_0} \quad (16)$$



## Comparison of estimated $G_1(s)$

$$G_{sys}(s) = \frac{600MW}{0.1Hz} \frac{f_0}{S_{sys}} \frac{1}{2H_{sys}s + K_{d_{sys}} * f_0} \quad (17)$$



# Outline



About me

Background

Previous work using PMUs

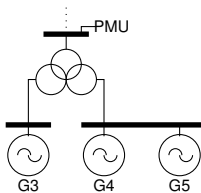
Validation of the approach

Simulation results

**Results from a real power plant**

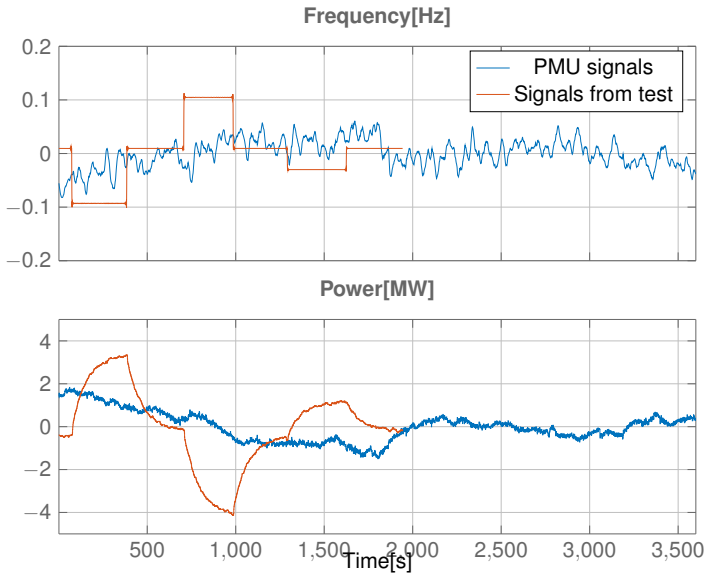
Conclusions and further work

## Single line diagram of the plant

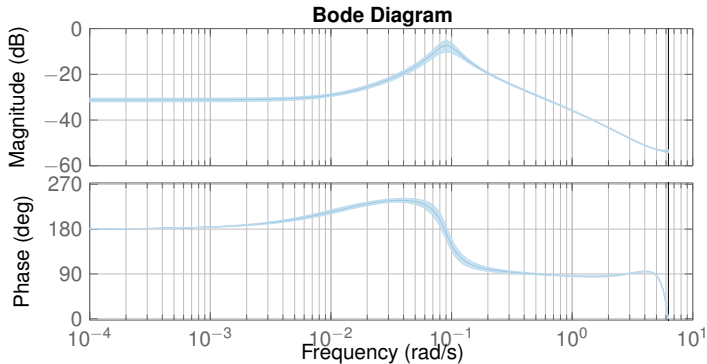




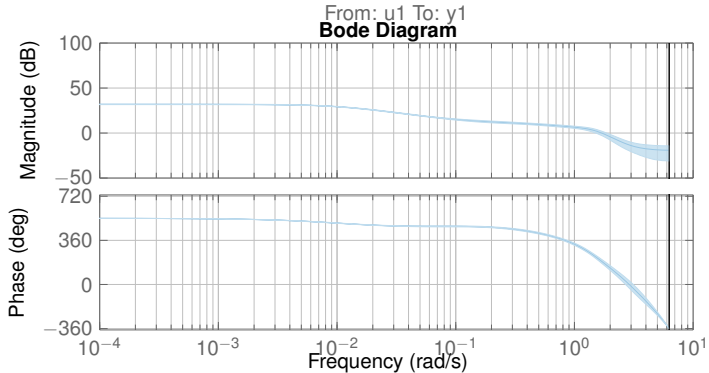
# Datasets used



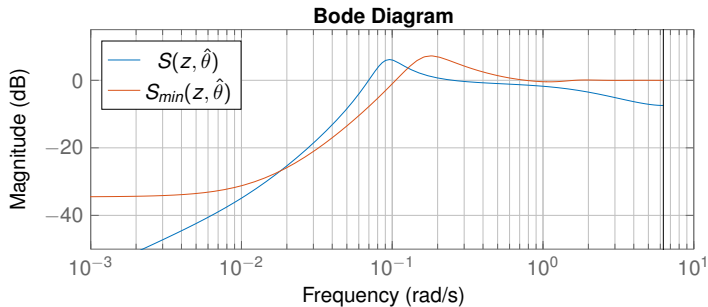
## Identified $G_1(s)$ using pmu signals



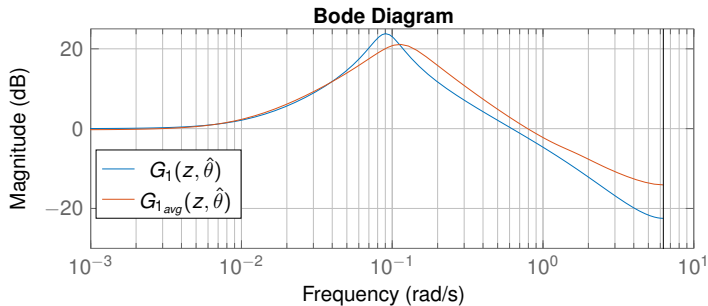
# Identified $G_{req}(s)$ using control system signals



# Estimated sensitivity functions



# Estimated $G_1(s)$



# Outline



About me

Background

Previous work using PMUs

Validation of the approach

Simulation results

Results from a real power plant

Conclusions and further work

## Conclusions and further work



- It is indeed possible to identify the turbine dynamics(closed loop with electromechanical dynamics) using PMU measurements.
- The identified transfer functions can be used for checking the requirements
- The tests in the requirements are most likely to intrusive
- It should be investigated how one can use data from the control system to get better estimates.



Thanks for your attention.