



# Frequency control and stability requirements on hydro power plants

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#### **Outline**

#### **Problem**

Methodology Paper I

Simple test system Paper II

Theoretical validation Paper III

Tests at Statkraft's power plants Paper IV

Simulation studies Paper V

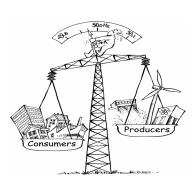
The best way to do the identification Paper V

Conclusions and further work

#### Load and production balancing

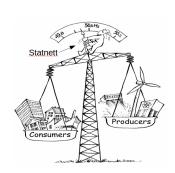


 The power system frequency measures the power balance.



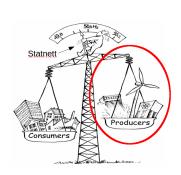
#### Load and production balancing

- The power system frequency measures the power balance.
- It is the responsibility of Statnett to control the frequency.



#### Load and production balancing

- The power system frequency measures the power balance.
- It is the responsibility of Statnett to control the frequency.
- However, it is the power plant owners who can control the frequency.



— Statnett pays all power plant owners to provide frequency control.(droop  $\rho = \Delta f/\Delta P$ )

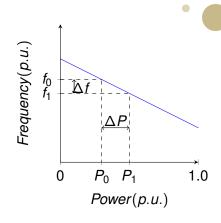


Figure: Frequency control response to step change in frequency

- Statnett pays all power plant owners to provide frequency control.(droop  $\rho = \Delta f/\Delta P$ )
- However, the system is not in steady state.

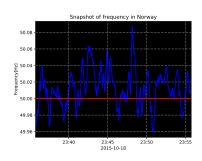


Figure: Frequency control response to step change in frequency

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- However, the system is not in steady state.
- Plants with the same droop settings don't have to behave the same.

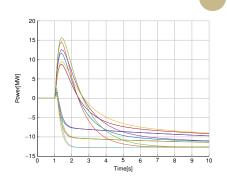


Figure: Frequency control response to step change in frequency

- Statnett pays all power plant owners to provide frequency control.(droop  $\rho = \Delta f/\Delta P$ )
- However, the system is not in steady state.
- Plants with the same droop settings don't have to behave the same.
- Renewable energy sources such as wind and solar don't contribute.

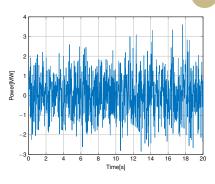
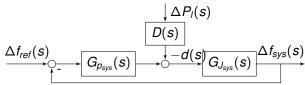


Figure: Frequency control response to step change in frequency

Puts requirements on an aggregated system model.

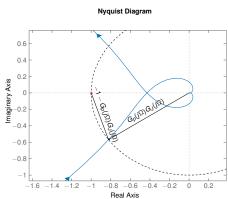




- Puts requirements on an aggregated system model.
- Stability requirement

$$M_{\mathcal{S}} = \max \left| \frac{1}{1 + G_{\mathcal{P}}(j\Omega)G_{\mathcal{J}}(j\Omega)} \right|$$

$$= \max \left| S(j\Omega) \right| \qquad (1)$$

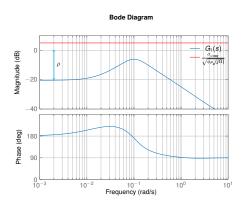


- Puts requirements on an aggregated system model.
- Stability requirement

Performance requirement

$$|G_1(j\Omega)| < rac{\sigma_{\omega_{req}}}{\sqrt{\phi_{P_e}(j\Omega)}}$$
 (2)

$$G_1(s) = S(s)G_J(s) \qquad (3)$$



- Puts requirements on an aggregated system model.
- Stability requirement

$$M_{S} = \max \left| \frac{1}{1 + G_{p}(j\Omega)G_{J}(j\Omega)} \right|$$

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$$G_1(s) = S(s)G_J(s) \qquad (3)$$

 Requirement per plant stated using a per unit conversion



#### **Future of frequency control**



- Power plants have to pass tests to get paid to provide frequency control.
- Only those who pass the tests get paid for the service.

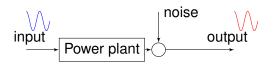


Figure: Test of power plant

#### Tests proposed by the industry

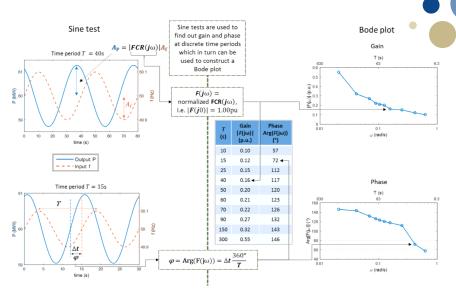
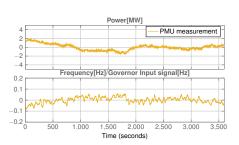


Figure: Testing procedure [source:ENTSO-E]

#### **Motivation**



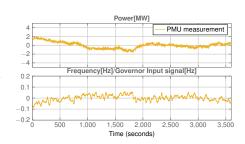
 The power system is never really in steady state.



#### **Motivation**



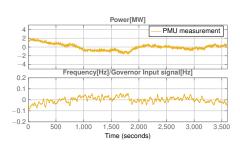
- The power system is never really in steady state.
- Can the power plant dynamics be identified from normal operation measurements?



#### **Research questions**

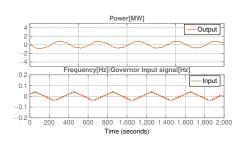


— Can power plant dynamics be identified using a PMU?



#### Research questions

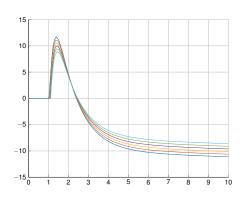
- Can power plant dynamics be identified using a PMU?
- Can power plant dynamics be identified using control system measurements without disturbing the operation of the plant?



#### Research questions



- Can power plant dynamics be identified using a PMU?
- Can power plant dynamics be identified using control system measurements without disturbing the operation of the plant?
- What is the effect of nonlinearities on the identification?



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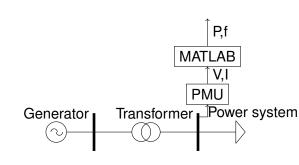
Simulation studies Paper V

The best way to do the identification Paper VI

Conclusions and further work

#### **Background**

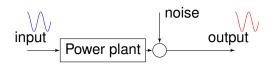
 Idea from<sup>1</sup> can the power plant dynamics be identified using PMUs



<sup>&</sup>lt;sup>1</sup>Dinh Thuc Duong et al. "Estimation of Hydro Turbine-Governor's Transfer Function from PMU Measurements". In: IEEE PES General Meeting. Boston: IEEE, July 2016

#### **Background**

- Idea from<sup>1</sup> can the power plant dynamics be identified using PMUs
- Uses the same input and output measurements as in the requirements:
  - Input: Power system frequency.
  - Output: Electric power.

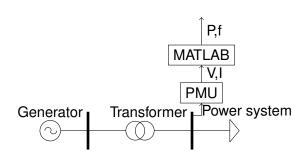


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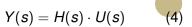
# Methodology



- Collect several datasets from PMUs.
- Calculate power and frequency from the measurements.
- Identify dynamics using vector fitting.
- Compare models.



#### **Vector fitting basics**



 Vector fitting fits a transfer function to measured input and output data

# **Vector fitting basics**

$$Y(s) = H(s) \cdot U(s) \tag{4}$$

- Vector fitting fits a transfer function to measured input and output data
- It assumes the system to have the following structure.

$$H(s) = d + \sum_{i=1}^{n_p} \frac{r_i}{s - p_i}$$
 (5)

# **Vector fitting basics**

$$Y(s) = H(s) \cdot U(s) \tag{4}$$

- Vector fitting fits a transfer function to measured input and output data
- It assumes the system to have the following structure.
- In time domain it is.

$$H(s) = d + \sum_{i=1}^{r_p} \frac{r_i}{s - p_i}$$
 (5)

$$y(t) \approx \tilde{d}x(t) + \sum_{i=1}^{n_p} \tilde{r}_i x_i - \sum_{i=1}^{n_p} \tilde{k}_i y_i$$
 (6)

$$x_i = \int_0^t e^{\tilde{p}_i(t-\tau)} x_i(\tau) d\tau \qquad (7)$$

$$y_i = \int_0^t e^{\tilde{p}_i(t-\tau)} y_i(\tau) d\tau \qquad (8)$$

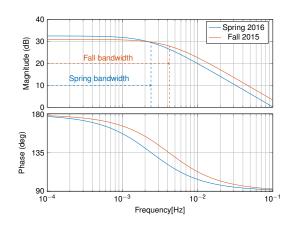
#### Vector fitting basics ctd.



— Find  $\tilde{d}$ ,  $\tilde{r}_i$  and  $\tilde{k}_i$  to minimize:

$$y(t) - (\tilde{d}x(t) + \sum_{i=1}^{n_p} \tilde{r}_i x_i - \sum_{i=1}^{n_p} \tilde{k}_i y_i)$$
 (9)

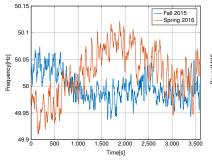
# Estimated droop and bandwidth

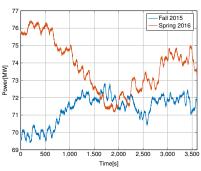


Dataset	Droop[%]	Bandwidth[mHz]
Fall 2015	10	4.16
Spring 2016	8	2.41

# Cross validation using distant data sets

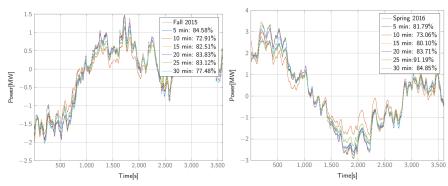






#### Cross validation using distant data sets

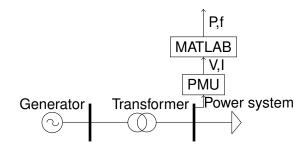




# Main contributions to the research questions

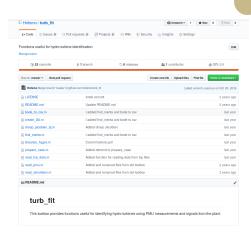


 Promising results for 19 datasets.



#### Main contributions to the research questions

- Promising results for 19 datasets.
- Developed code for interfacing with the PMU data.



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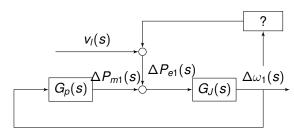
The best way to do the identification Paper V

Conclusions and further work

#### Motivation

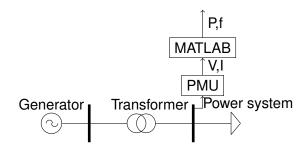


- Explain the problem to my co-supervisor.
- Create a model for analysing the identifiability of hydro power plant dynamics.

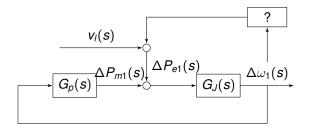


— From the PMU we get



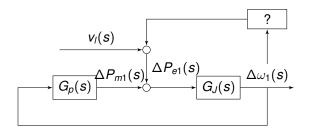


- From the PMU we get
  - Power:  $\Delta P_{e1}(s)$ .



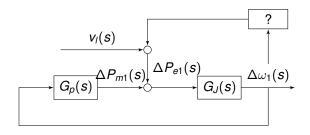


- From the PMU we get
  - Power:  $\Delta P_{e1}(s)$ .
  - Frequency:  $\Delta f(s)$ .

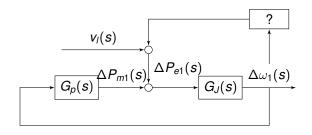




- From the PMU we get
  - Power:  $\Delta P_{e1}(s)$ .
  - Frequency:  $\Delta f(s)$ .
- We need to model how  $\Delta P_{e1}(s)$  and  $\Delta f(s)$  is related through the power system.



- From the PMU we get
  - Power:  $\Delta P_{e1}(s)$ .
  - Frequency:  $\Delta f(s)$ .
- We need to model how  $\Delta P_{e1}(s)$  and  $\Delta f(s)$  is related through the power system.
- We also need to model the power plant consisting of  $G_p(s)$  and  $G_J(s)$ .

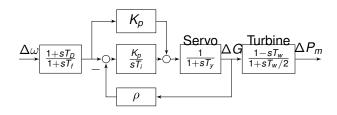


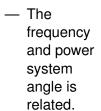


## Power plant model

- Model for  $G_p(s)$
- Model for  $G_J(s)$

$$G_J(s) = \frac{1}{2Hs + K_d} \tag{10}$$





$$\Delta\theta(s) = \frac{2\pi f_s}{s} f(s) \tag{11}$$

- The frequency and power system angle is related.
- The angle and power is related.

$$\Delta\theta(s) = \frac{2\pi f_s}{s} f(s) \tag{11}$$

$$P_k \approx \sum_{m \in \Omega_k} x_{km}^{-1} \theta_{km} \tag{12}$$

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- The angle and power is related.
- On matrix form.

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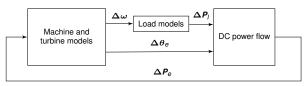
$$\mathbf{P} = \mathbf{Y}\theta \tag{13}$$

- The frequency and power system angle is related.
- The angle and power is related.
- On matrix form.
- In software

$$\Delta\theta(s) = \frac{2\pi f_s}{s} f(s) \tag{11}$$

$$P_k \approx \sum_{m \in \Omega_k} x_{km}^{-1} \theta_{km} \tag{12}$$

$$\mathbf{P} = \mathbf{Y}\theta \tag{13}$$



# **Test system**



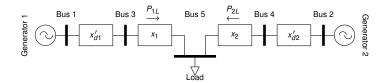
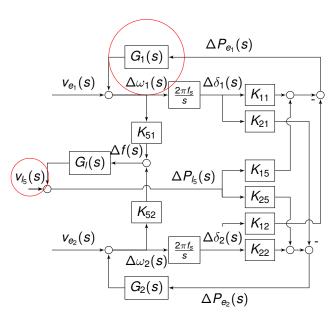
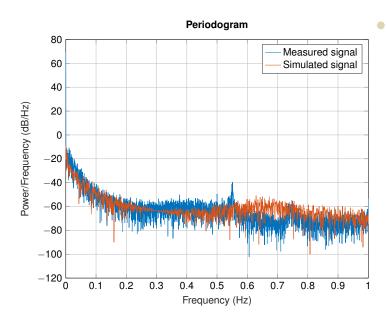


Figure: Single line diagram

## **Test system**



### **Simulation Result**



#### **Main contributions**



- Developed simple test system for analysing power plant identifiability using PMUs.
- Developed simple test system used in the proceeding papers for simulations.

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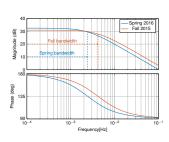
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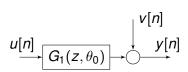
The best way to do the identification Paper VI

Conclusions and further work

— Why do we get different results?



- Why do we get different results?
- The signals we use are corrupted by noise.





- Why do we get different results?
- The signals we use are corrupted by noise.
- From system identification we have that the error will be asymptotic normally distributed

$$\sqrt{N}(\hat{ heta}_n - heta^*) \in extit{AsN}(0, P_{ heta})$$

- Why do we get different results?
- The signals we use are corrupted by noise.
- From system identification we have that the error will be asymptotic normally distributed
- However, first we need to prove the identifiability of the system

True system: S x: unbiased x: biased





# System identification basic

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

$$S: y[n] = G_1(z, \theta_1)u[n] + H_1(z, \theta_1)e[n]$$
(14)

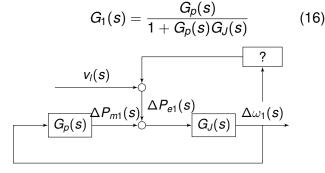
— Using the data set  $Z^N$  we want to find the parameter vector  $\theta^N$  minimizing

$$u[n] \xrightarrow{G_1(z,\theta_0)} \xrightarrow{V[n]} y[n]$$

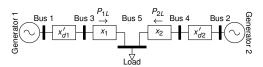
$$\hat{\theta}_{N} = \arg\min_{\theta} \frac{1}{N} \sum_{n=1}^{N} [H_{1}^{-1}(z,\theta)(y[n] - G_{1}(z,\theta)u[n])]^{2}$$
(15)



 The system we are identifying

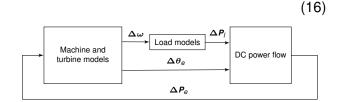


- The system we are identifying
- We use a small power system

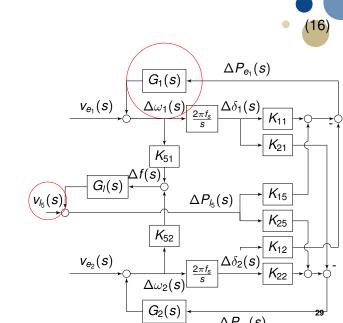


(16)

- The system we are identifying
- We use a small power system
- We use a dc power flow



- The system we are identifying
- We use a small power system
- We use a dc power flow
- This results in the following block diagram





 A consistent estimate of the closed loop transfer function of the turbine and electromechanical dynamics can be obtained by using:



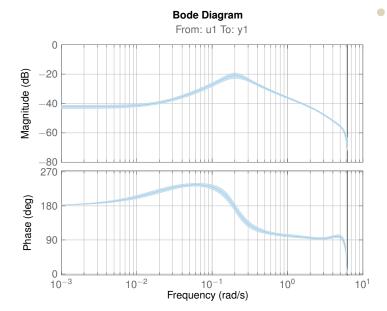
- A consistent estimate of the closed loop transfer function of the turbine and electromechanical dynamics can be obtained by using:
  - Measured PMU frequency as the output u[n]



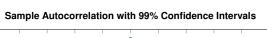
- A consistent estimate of the closed loop transfer function of the turbine and electromechanical dynamics can be obtained by using:
  - Measured PMU frequency as the output u[n]
  - Measured PMU power as the input y[n]

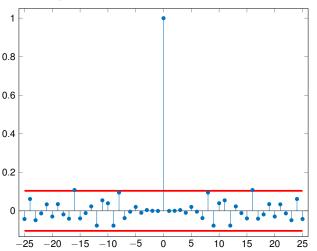
- A consistent estimate of the closed loop transfer function of the turbine and electromechanical dynamics can be obtained by using:
  - Measured PMU frequency as the output u[n]
  - Measured PMU power as the input y[n]
- The proof was done with the following assumptions.
  - The system is excited by a load acting as a filtered white noise process
  - The measurement error of the electrical power is negligible.
  - The measured frequency is a good estimate of the generator speed.

# Model obtained using PMU data



### Whiteness test on model identified using PMU data





#### Main contributions



- To show that the transfer function one is identifying using PMUs is  $G_1(s)$ .
- To prove under which conditions a consistent estimate of  $G_1(s)$  is possible.
- To demonstrate the theory for identification of  $G_1(s)$  on real datasets.

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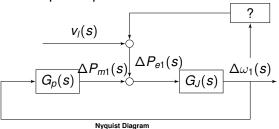
### **Motivation**

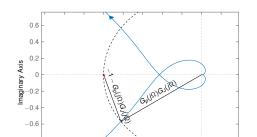


- Relate the results from Paper III and the new requirements.
- Test the methods on more real datasets.
- Demonstrate that industry proposed tests can be done easier.
- Less theoretical presentation in a more industry focused conference.

### Alternative requirements

 Place requirements directly on one power plant.



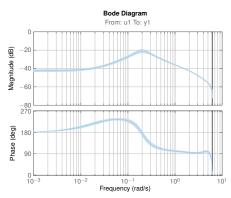




### Alternative requirements



- Place requirements directly on one power plant.
- We already have an estimate of  $G_1(s)$ .



### Alternative requirements



- Place requirements directly on one power plant.
- We already have an estimate of  $G_1(s)$ .
- We need to find S(s)



$$G_1(s)$$

$$G_1(s)=G_J(s)S(s)$$

(17)



$$G_1(s) = G_J(s)S(s) \tag{17}$$

$$G_J(s) = \frac{1}{2Hs + K_d} \tag{18}$$



$$G_1(s) = G_J(s)S(s) \tag{17}$$

$$G_J(s) = \frac{1}{2Hs + K_d} \tag{18}$$

$$2H >> K_d \tag{19}$$



$$G_1(s) = G_J(s)S(s) \tag{17}$$

$$G_J(s) = \frac{1}{2Hs + K_d} \tag{18}$$

$$2H >> K_d \tag{19}$$

$$S(s) \approx 2HsG_1(s)$$
 (20)

$$G_1(s) = G_J(s)S(s) \tag{17}$$

\_

$$G_J(s) = \frac{1}{2Hs + K_d} \tag{18}$$

\_

$$2H >> K_d \tag{19}$$

\_

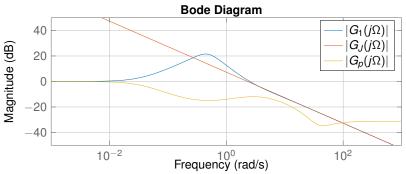
$$S(s) \approx 2HsG_1(s)$$

(20)

— Need to estimate H

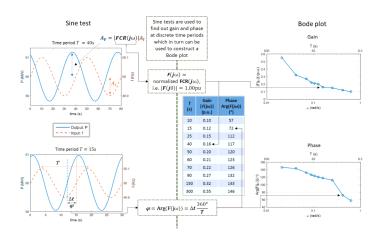
# Estimating H





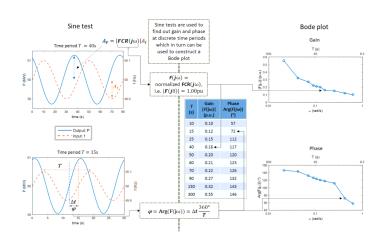
#### **Dataset from Statkraft**

Norway's biggest power producers.



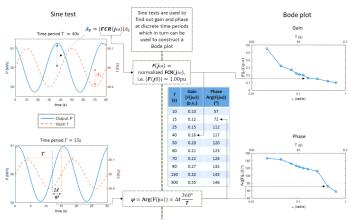
#### **Dataset from Statkraft**

- Norway's biggest power producers.
- They performed the tests from the draft requirements

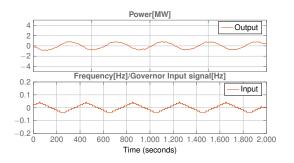


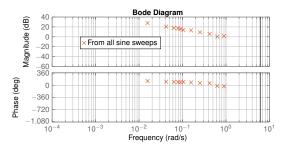
#### **Dataset from Statkraft**

- Norway's biggest power producers.
- They performed the tests from the draft requirements
- By chance I had PMU measurements from the same plant.

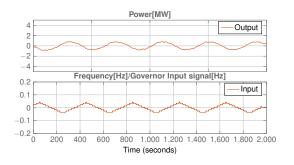


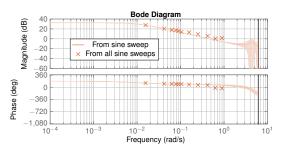
### Can the industry proposed tests be done easier?



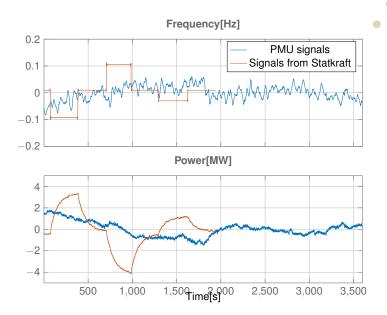


### Can the industry proposed tests be done easier?



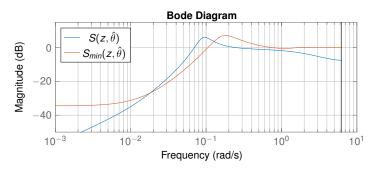


#### **Datasets used**



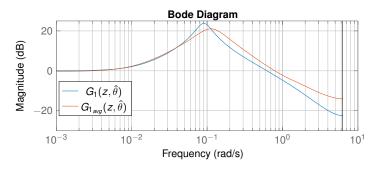
## **Estimated sensitivity functions**

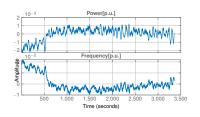


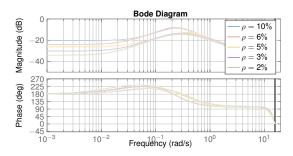


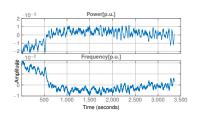
# **Estimated** $G_1(s)$

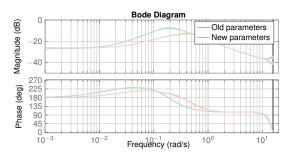


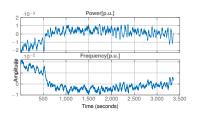


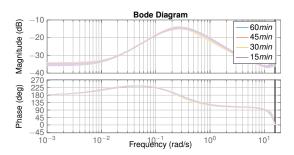


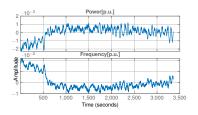












Droop	$60 \mathrm{min}$	$45\mathrm{min}$	$30 \mathrm{min}$	$15 \mathrm{min}$
10%	9.5%	9.5%	9.5%	9.5%
6%	6.2%	6.0%	5.9%	6.1%
5%	4.9%	4.9%	5.0%	5.1%
3%	3.1%	3.1%	3.1%	2.9%
2%	2.0%	1.8%	1.8%	1.7%

#### **Main Contributions**



- Proposal for alternative tests.
- Demonstrating that the proposed methods can detect parameter changes.
- Demonstrated that the industry proposed tests can be done easier.

#### **Outline**

Problem

Methodology Paper I

Simple test system Paper II

Theoretical validation Paper III

Tests at Statkraft's power plants Paper IV

Simulation studies Paper V

The best way to do the identification Paper V

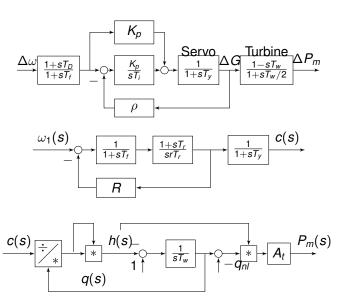
Conclusions and further work

#### **Motivation**



- Test with a more detailed power plant model.
- Test with a more detailed power system model.
- Investigate some of the assumptions from previous papers.

### More detailed power plant model



## More detailed power system model



 Added the frequency divider formula to the simple test system.

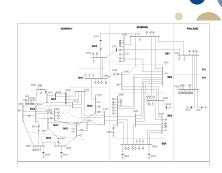
$$\omega_I = \mathbf{1} + \mathbf{D}(\omega_e - \mathbf{1})$$
 (21)

where

$$\mathbf{D} = -\mathbf{B}_{22}^{-1}\mathbf{B}_{21} \qquad (22)$$

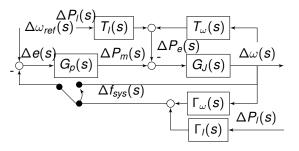
## More detailed power system model

- Added the frequency divider formula to the simple test system.
- Used the Nordic 44 test system in PSS/E.

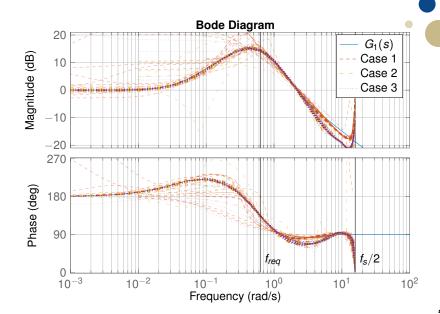


#### **Identification cases**

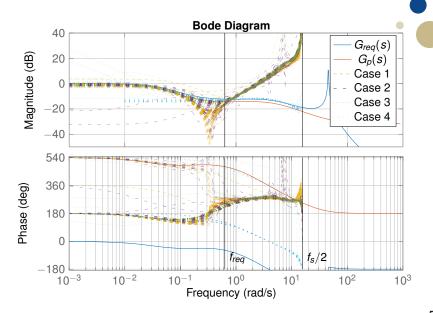
- 1. Case 1 Normal operation and speed feedback.
- 2. Case 2 Normal operation, speed feedback and PMU.
- 3. Case 3 Normal operation, frequency feedback and PMU.
- 4. Case 4 Open loop operation.



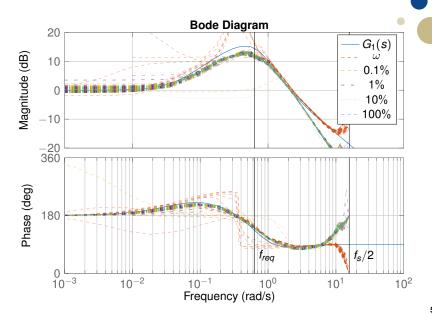
#### Test the different cases



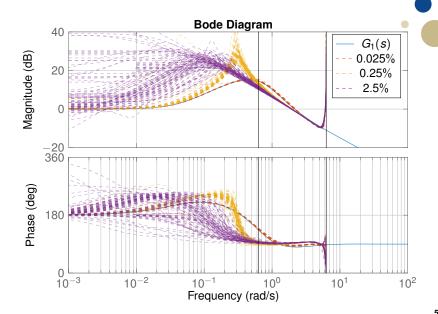
#### Test the different cases



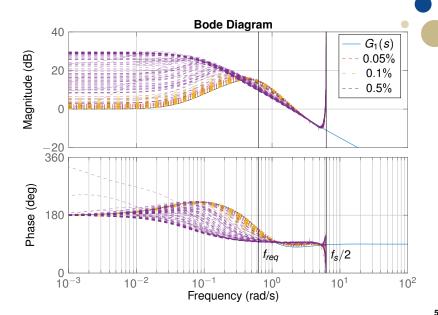
## **Test frequency assumption**



#### Test backlash

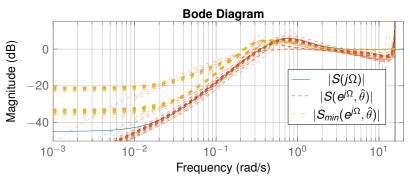


#### Test deadband



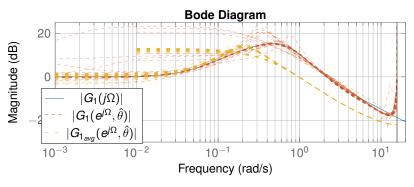
## Sensitivity function S(s)





## Disturbance rejection function $G_1(s)$





# **Comparison of stability margins**



Method	Median	Root mean square error (RMSE)
$\max  \mathcal{S}(j\Omega) $	1.84	0
$\max  S(e^{j\Omega},\hat{\theta}) $ , Case 1	1.84	0.25
$\max  S(e^{j\Omega},\hat{ heta}) $ , Case 2	1.75	0.34
$\max  S(e^{j\Omega}, \hat{\theta}) $ , Case 3	1.74	0.39
$\max  \mathcal{S}_{min}(oldsymbol{e}^{oldsymbol{j}\Omega},\hat{ heta}) $	1.66	0.25

## **Comparison of estimated inertias**



Case	Median	RMSE
Actual	3.5	0
Case 1	3.40	0.46
Case 2	3.33	0.40
Case 3	3.27	0.43

### **Major contributions**



- Tested the methods with a more detailed power plant model.
- Tested the methods with a more detailed power system model.
- Investigate some of the assumptions from previous papers.

#### **Outline**

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The best way to do the identification Paper VI

Conclusions and further work

#### **Motivation**



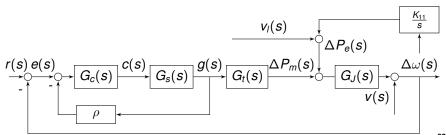
 How to best identify hydro power plant dynamics given access to control system data.

$$e(s) = G_1(s)\Delta P_{e1}(s) + S(s)r(s)$$

$$\Delta\omega_1(s) = G_s(s)G_t(s)G_J(s)c(s) - G_J(s)\Delta P_{e1}(s)$$

$$G_c(s)G_s(s)G_t(s)G_J(s)$$
(24)

$$G_{p}(s) = \frac{G_{c}(s)G_{s}(s)G_{t}(s)G_{J}(s)}{G_{J}(s)(1 + \rho G_{c}(s)G_{s}(s))}$$
(25)



62



$$e(s) = G_1(s)\Delta P_{e1}(s) + S(s)r(s)$$
 (23)

$$\Delta\omega_1(s) = G_s(s)G_t(s)G_J(s)c(s) - G_J(s)\Delta P_{e1}(s)$$
 (24)

$$G_{\rho}(s) = \frac{G_{c}(s)G_{s}(s)G_{t}(s)G_{J}(s)}{G_{J}(s)(1 + \rho G_{c}(s)G_{s}(s))}$$
(25)

Two approaches.



$$e(s) = G_1(s)\Delta P_{e1}(s) + S(s)r(s)$$
 (23)

$$\Delta\omega_1(s) = G_s(s)G_t(s)G_J(s)c(s) - G_J(s)\Delta P_{e1}(s)$$
 (24)

$$G_{\rho}(s) = \frac{G_{c}(s)G_{s}(s)G_{t}(s)G_{J}(s)}{G_{J}(s)(1 + \rho G_{c}(s)G_{s}(s))}$$
(25)

- Two approaches.
- Extra excitation is needed.



$$e(s) = G_1(s)\Delta P_{e1}(s) + S(s)r(s)$$
 (23)

$$\Delta\omega_1(s) = G_s(s)G_t(s)G_J(s)c(s) - G_J(s)\Delta P_{e1}(s)$$
 (24)

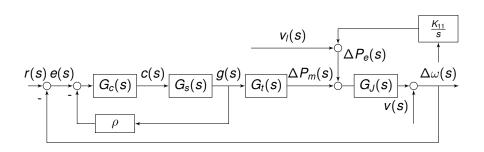
$$G_{\rho}(s) = \frac{G_{c}(s)G_{s}(s)G_{t}(s)G_{J}(s)}{G_{J}(s)(1+\rho G_{c}(s)G_{s}(s))}$$
(25)

- Two approaches.
- Extra excitation is needed.
- PMU approach is a special case without extra excitation.

## Identifiability

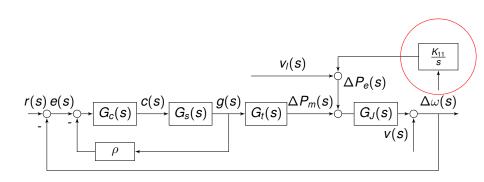


— The systems can be identified



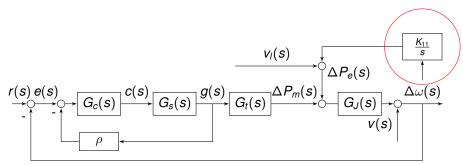
# Identifiability

- The systems can be identified
- However, there is a lack of delay



# Identifiability

- The systems can be identified
- However, there is a lack of delay
- This is no problem if  $v(s) \ll v_l(s)$ .



# **Identifying** $G_p(s)$ and $G_J(s)$

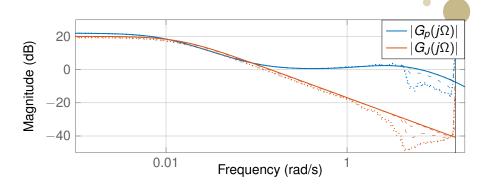


Figure: The mean value of  $|G_p(e^{j\Omega},\hat{\theta}_N)|$  and  $|G_J(e^{j\Omega},\hat{\theta}_N)|$  calculated from the MCS. The solid lines are the analytical calculated versions and the dashed loosely dashed dotted and loosely dotted lines represent an SNR of 50dB, 26dB, 6dB, and 3dB respectively

## Identifying S(s)

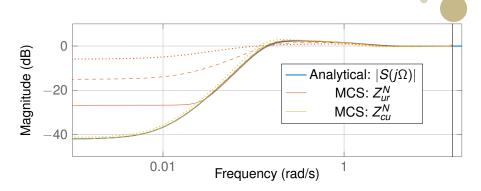


Figure: The mean value of  $|S(e^{j\Omega}, \hat{\theta}_N)|$  calculated analytical and from the MCS. The solid, dashed and dotted lines represent an SNR of 50dB, 26dB, and 6dB respectively

## **Identifying** $G_1(s)$

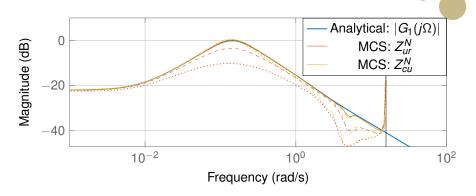


Figure: The mean value of  $|G_1(e^{j\Omega}, \hat{\theta}_N)|$  calculated analytical and from the MCS. The solid, dashed and dotted lines represent an SNR of 50dB, 26dB, and 6dB respectively

### **Major contributions**



- Demonstrated two methods for finding transfer functions for checking the requirements in closed loop.
- Analytical validation of the demonstrated methods.
- Addressed the delay condition.

#### **Outline**

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The best way to do the identification Paper V

Conclusions and further work

#### **Conclusions**



- The requirements can be checked using PMU-measurements, however, the results will be biased for faster dynamics.
- The requirements can be checked using control system measurements in normal operation, however, the results may be biased for faster dynamics.
- The requirements can be checked using measurement from normal operation with extra excitation

#### **Further work**



- Validate approaches in the lab
- Solve the delay condition.
- Handle backlash.
- Investigate the alternative requiremens.