



Underground Reservoir Identification Using Generalized Wellbore Data

M. Mansoori^{1,2}, A. Dankers^{1,4}, P.M.J. Van den Hof³, J.-D Jansen¹ , D. Rashtchian²

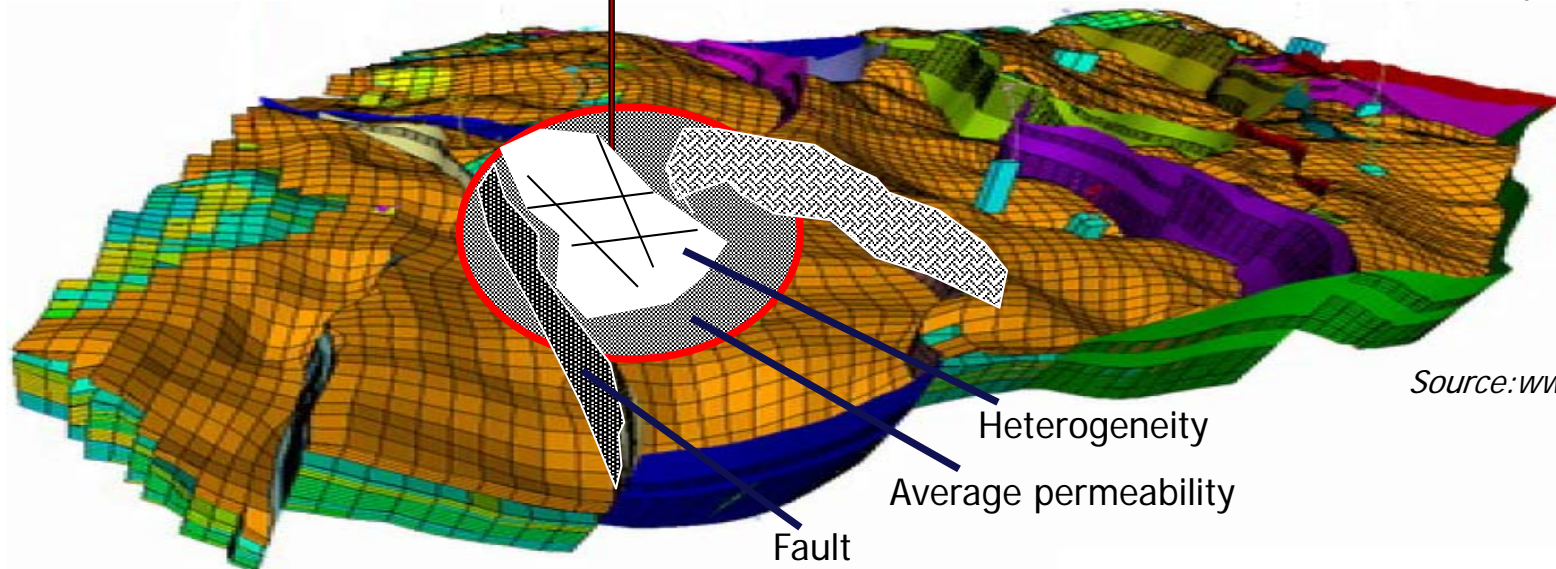
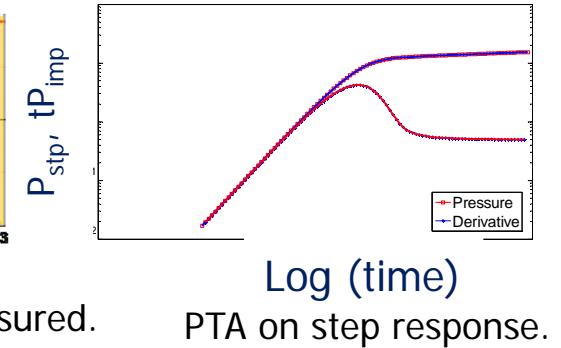
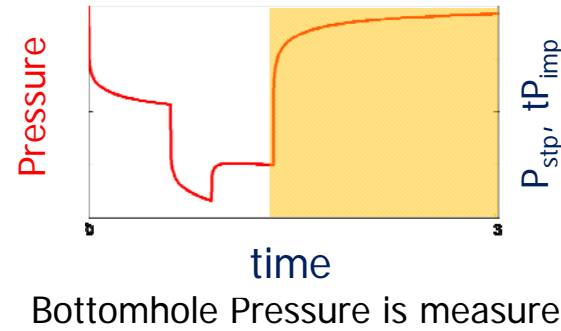
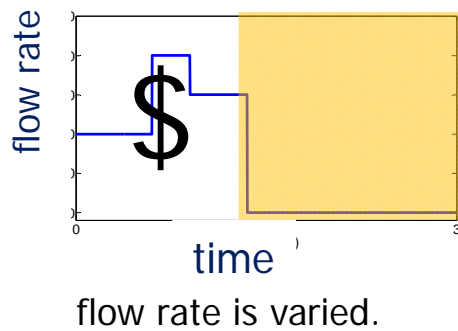
1: Delft University of Technology, the Netherlands

2: Sharif University of Technology, Iran

3: Eindhoven University of Technology, the Netherlands

4: University of Calgary

Well Testing



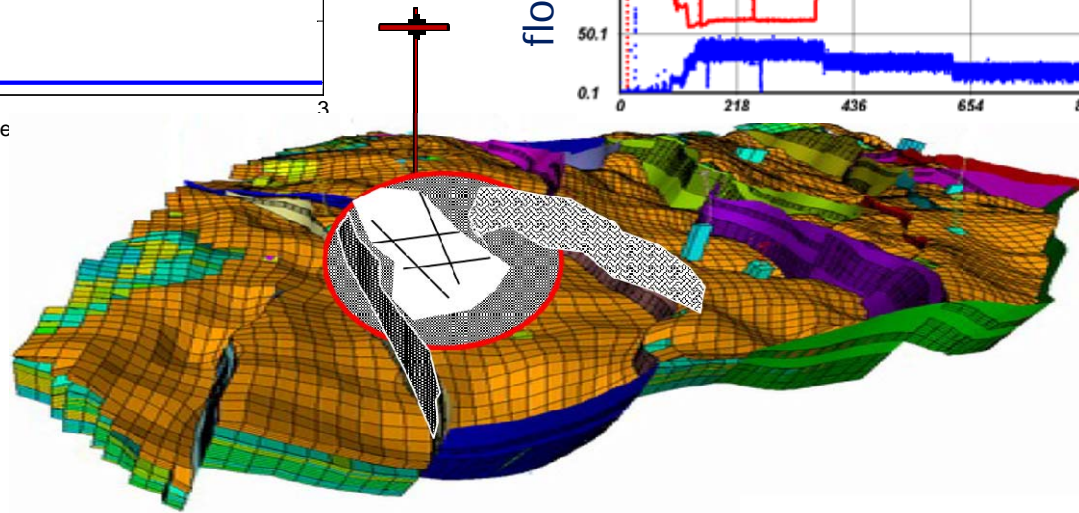
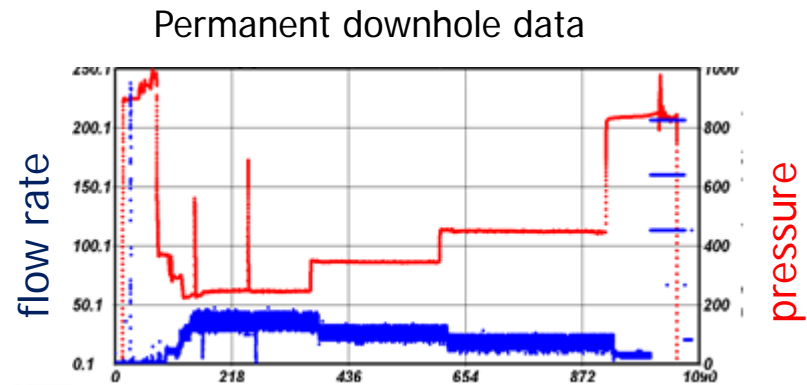
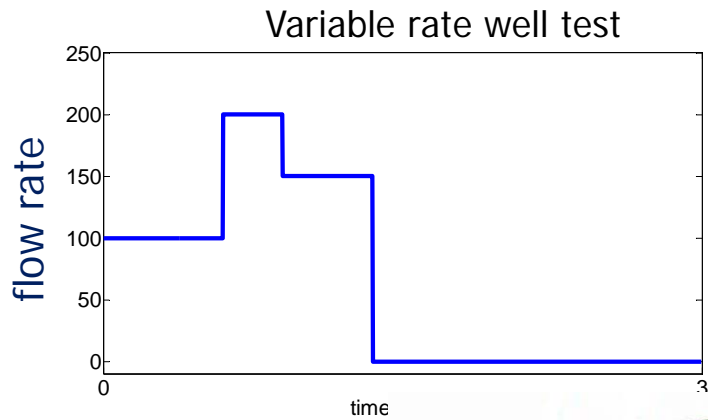
Source: www.slb.com

- ❑ **Permeability** distribution determines flow pattern of hydrocarbon in the reservoir.
- ❑ Most representative permeability information data around the wells by **well test**.

Problem Statement

Our goal is to do well test analysis on variable flow rate data and obtain reservoir information

Sources of variable rate data





Outline

- ❑ Well test analysis in the system identification framework
- ❑ EIV problem with IV
- ❑ Physical parameter estimation
- ❑ Experimental results

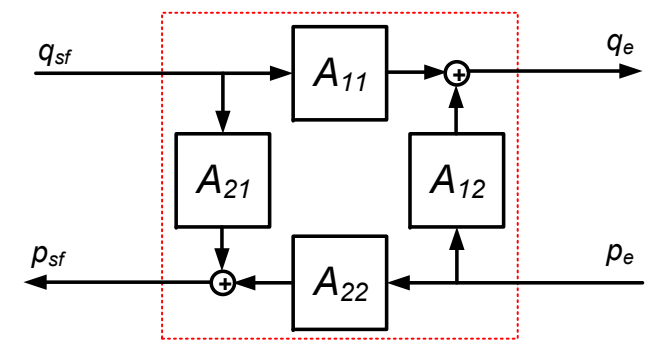
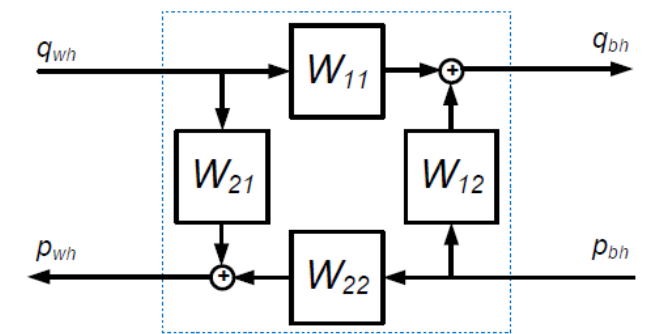
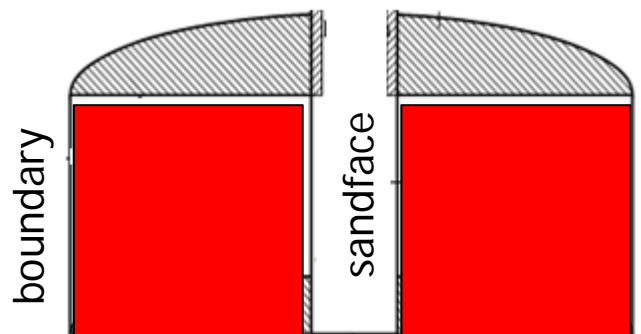
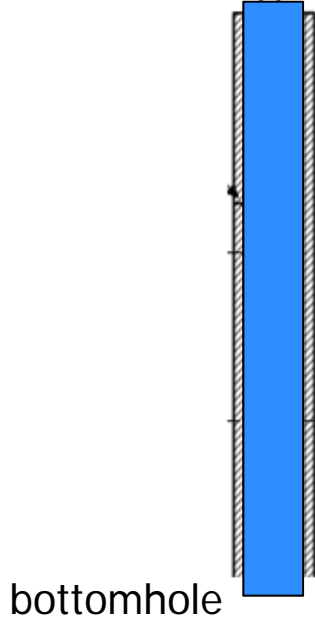
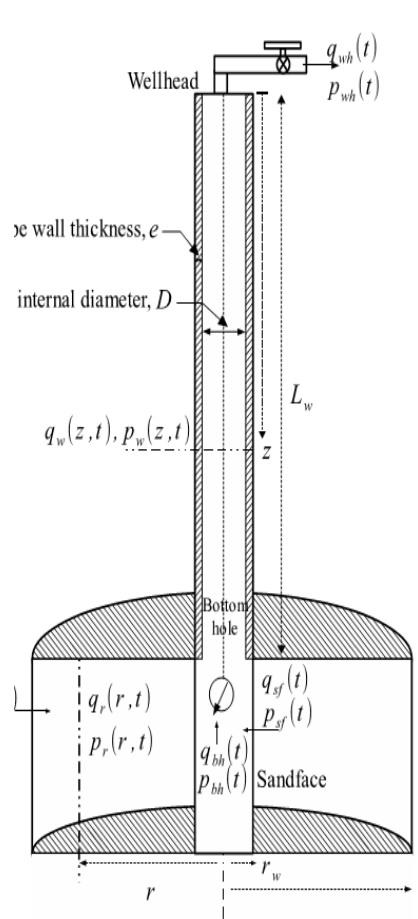


Problem in well test :

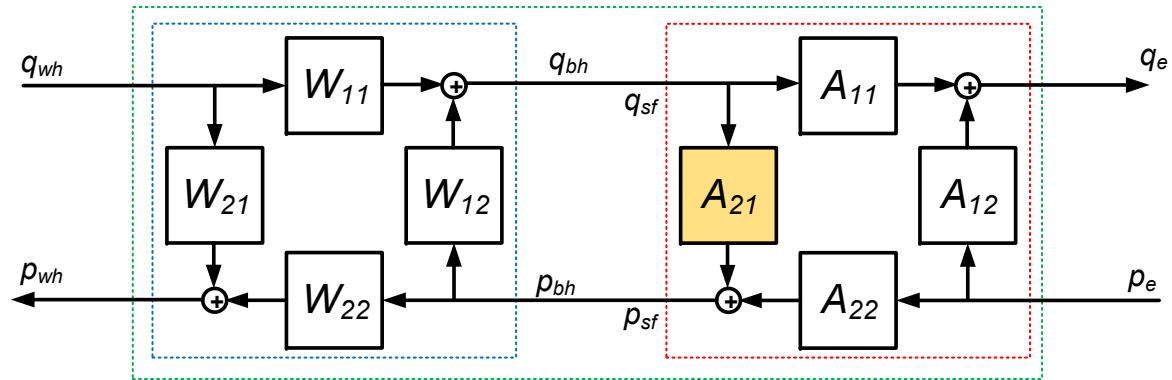
Given a set of measured (noisy) p_{bh}^m , and variable (noisy) q_{bh}^m

Identify the **reservoir model (and corresponding physical properties)**

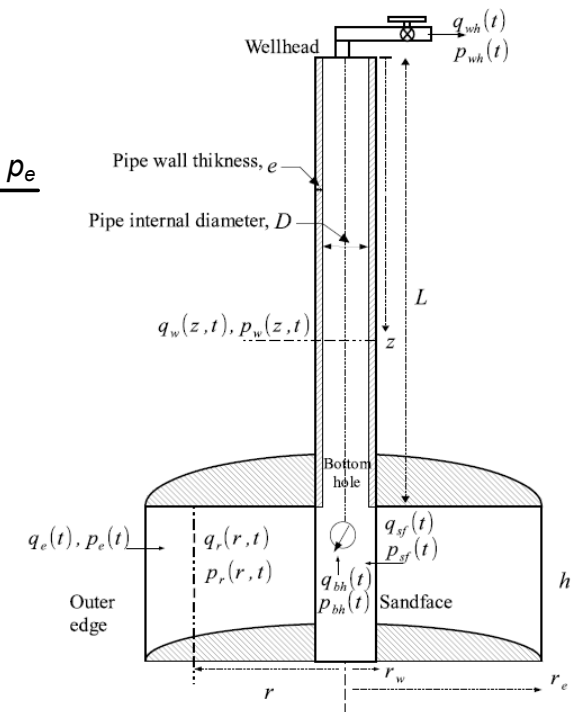
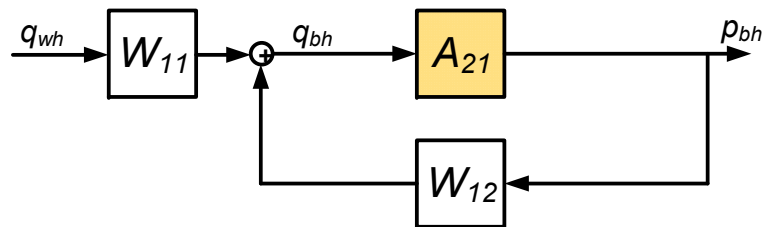
Port-based Modelling of Production System



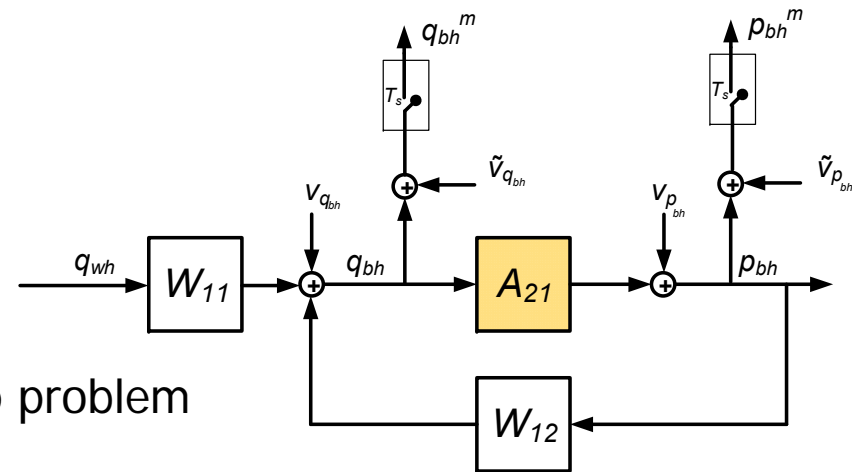
Bilaterally Coupling the Systems



After simplification and keeping the relevant terms:



Well Test Measurements



A Errors-In-Variable (EIV) in Closed Loop problem

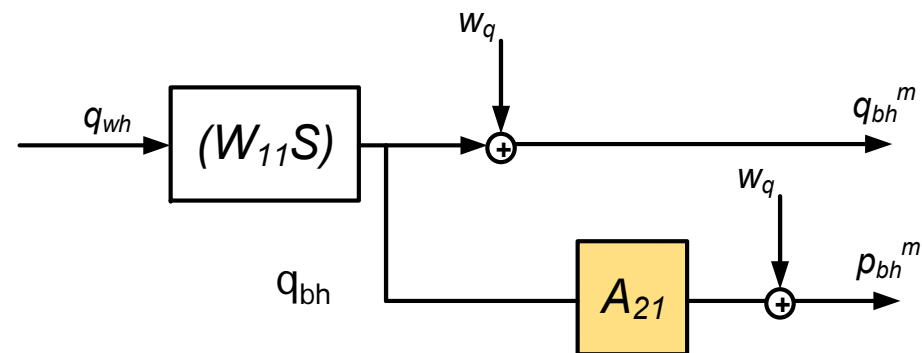
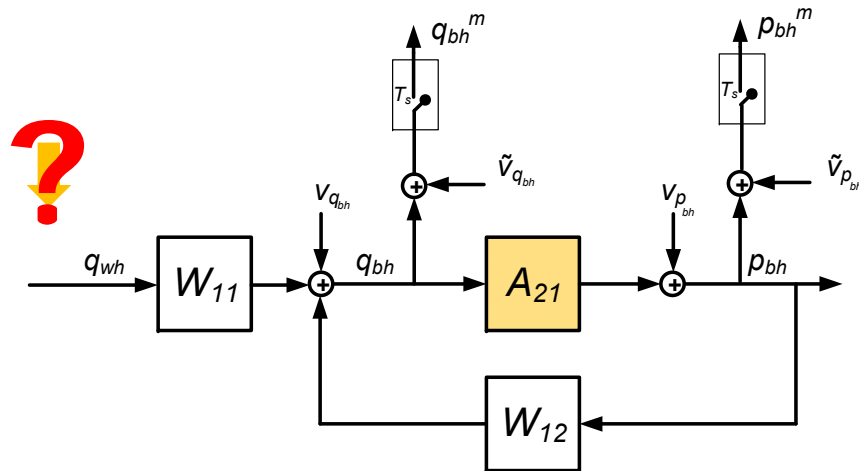
$$q_{bh}^m(k) = (W_{11}S)(q^{-1})q_{wh}(k) + w_q(k),$$

$$p_{bh}^m(k) = (A_{21}W_{11}S)(q^{-1})q_{wh}(k) + w_p(k).$$

Identifiability analysis shows that in general A_{21} can not be identified uniquely on the basis of the noisy input and output signals only

(Söderström, 2013)

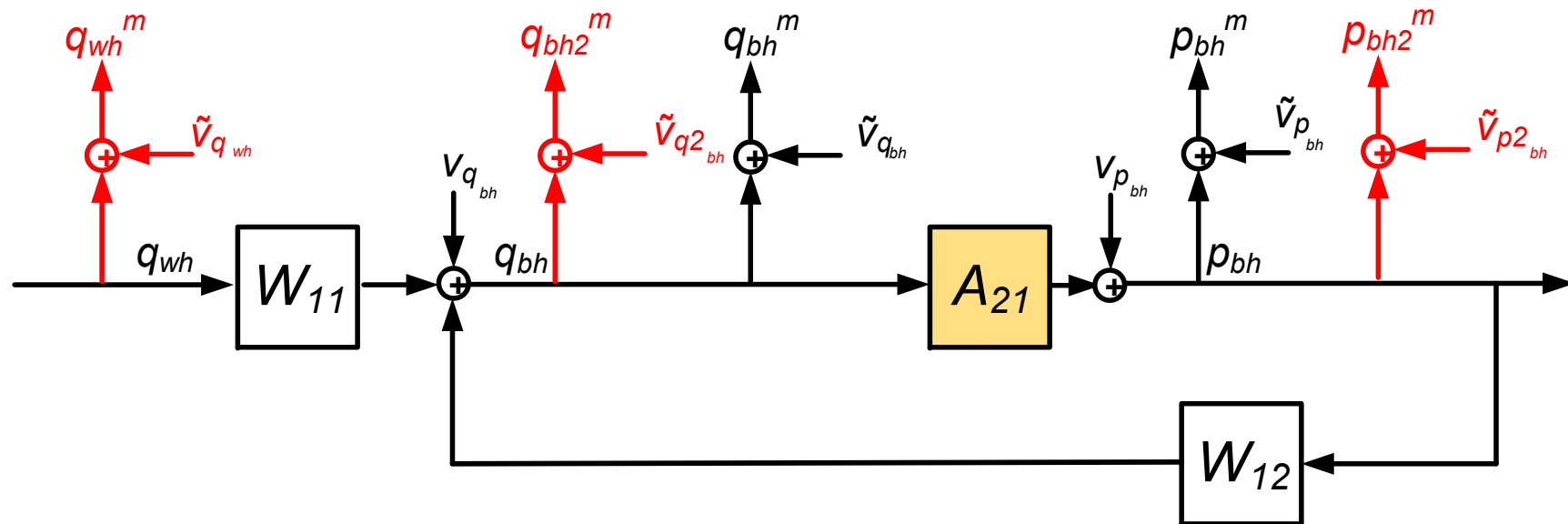
Two-stage Closed-loop Identification



can be interpreted as iv-method, with iv-signal q_{wh}

Alternative Options

Using other measurements in the system as *Instrumental Variable (IV)* signal



EIVIV algorithm

Dankers et al., IFAC 2014; Automatica, Jan 2016

Plant data generating system

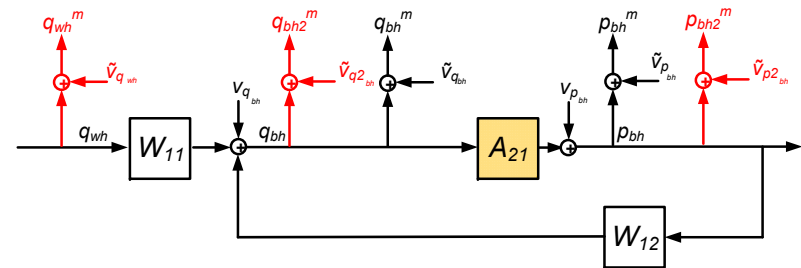
$$p_{bh}^m(k) = A_{21}(q^{-1})q_{bh}(k) + w_p(k)$$

One-step predictor signal

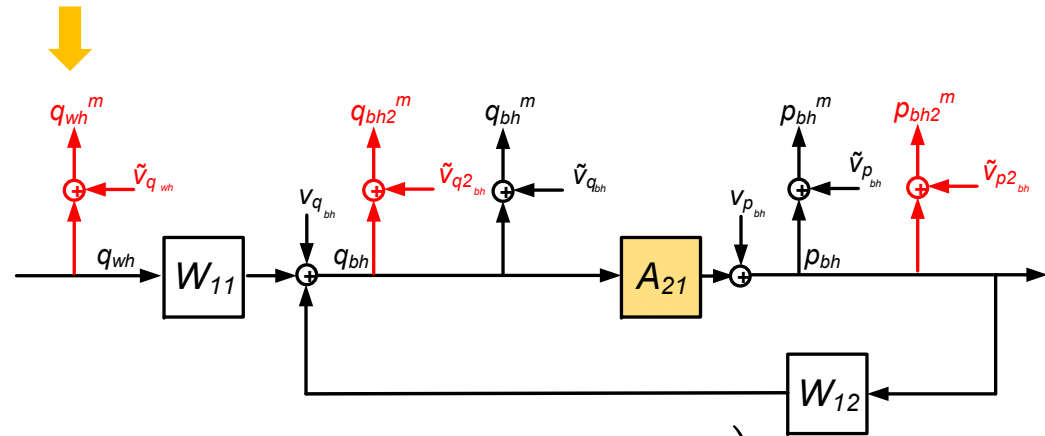
$$\varepsilon(\tau, \theta) = H^{-1}(q^{-1}, \theta) [p_{bh}^m(\tau) - G(q, \theta)q_{bh}(\tau)]$$

Using IV signal, denoted as z , and calculate the cross-correlation with the predictor signal:

$$\begin{aligned} R_{\varepsilon z}(\tau, \theta) &= H^{-1}(q, \theta) (R_{p_{bh}^m z}(\tau) - G(q, \theta)R_{q_{bh} z}(\tau)) \\ &= H^{-1}(q, \theta) \left(A_{21}(q^{-1})R_{q_{bh} z}(\tau) + R_{w_p z}(\tau) - G(q, \theta)R_{q_{bh} z}(\tau) \right) \\ &= H^{-1}(q, \theta) \left(A_{21}(q^{-1})R_{q_{bh}^m z}(\tau) + R_{w_p z}(\tau) - G(q, \theta)R_{q_{bh}^m z}(\tau) \right) \end{aligned}$$



EIVIV algorithm



$$R_{\varepsilon z}(\tau, \theta) = H^{-1}(q, \theta) \left(A_{21}(q)R_{q_{bh}^m z}(\tau) + R_{w_p z}(\tau) - G(q, \theta)R_{q_{bh}^m z}(\tau) \right)$$

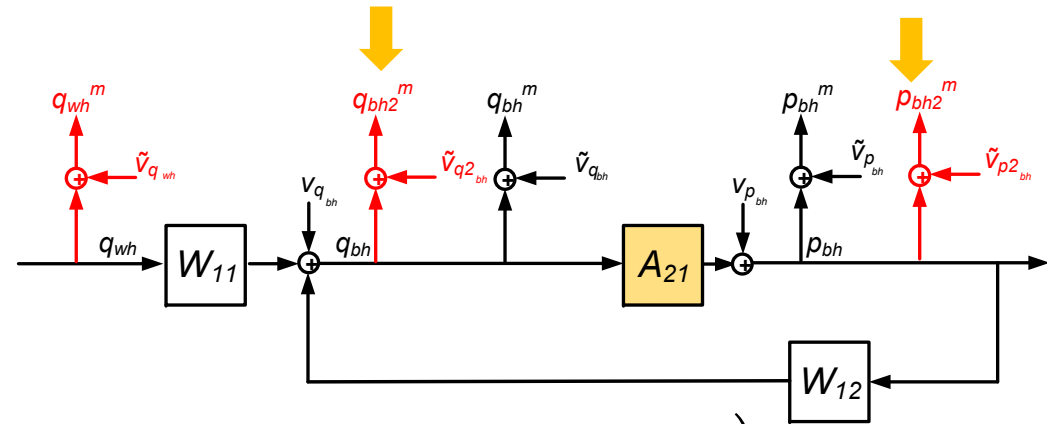
Case 1: z is uncorrelated with w_p then $R_{w_p z}(\tau) = 0$.

Thus $A_{21}(q^{-1}) = G(q, \theta)$ iff $R_{\varepsilon z}(\tau, \theta) = 0$ for all τ

Hence by having $V_N(\theta^*) = \frac{1}{N} \sum_{\tau=0}^{N-1} R_{\varepsilon z}^2(\tau, \theta^*) = 0$ then $R_{\varepsilon z}(\tau, \theta^*) = 0$

and consequently $A_{21}(q^{-1}) = G(q, \theta^*)$.

EIVIV algorithm



$$R_{\varepsilon z}(\tau, \theta) = H^{-1}(q, \theta) \left(A_{21}(q)R_{q_{bh}^m z}(\tau) + R_{w_p z}(\tau) - G(q, \theta)R_{q_{bh}^m z}(\tau) \right)$$

Case 1: z is correlated with w_p then

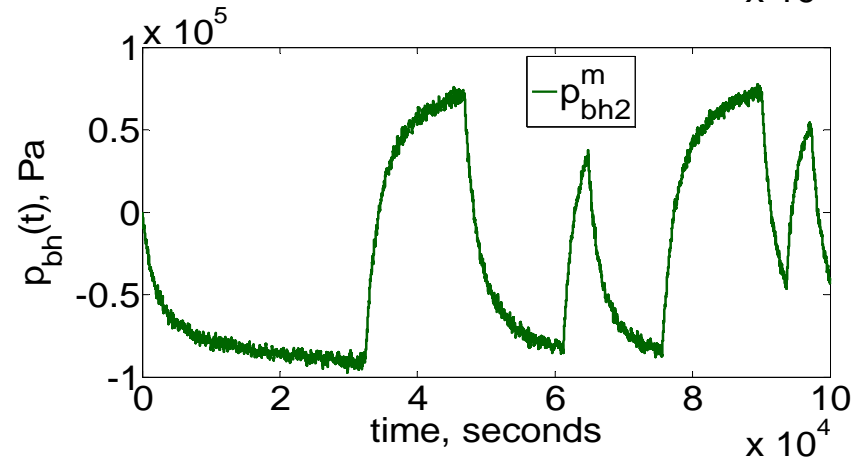
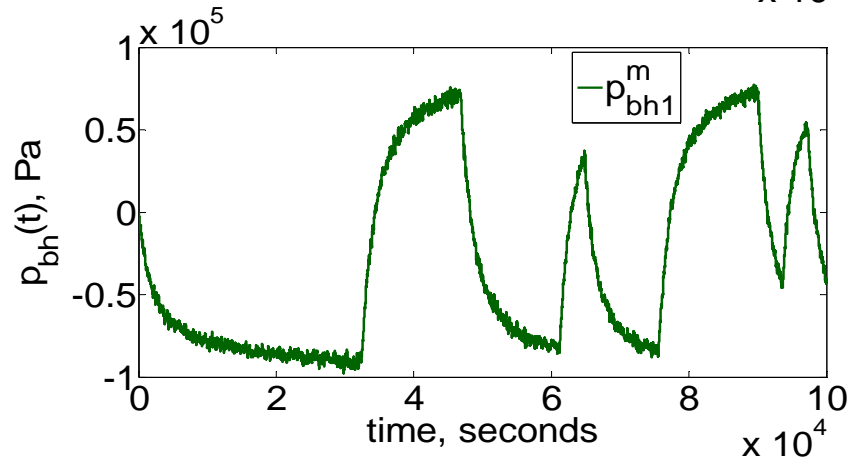
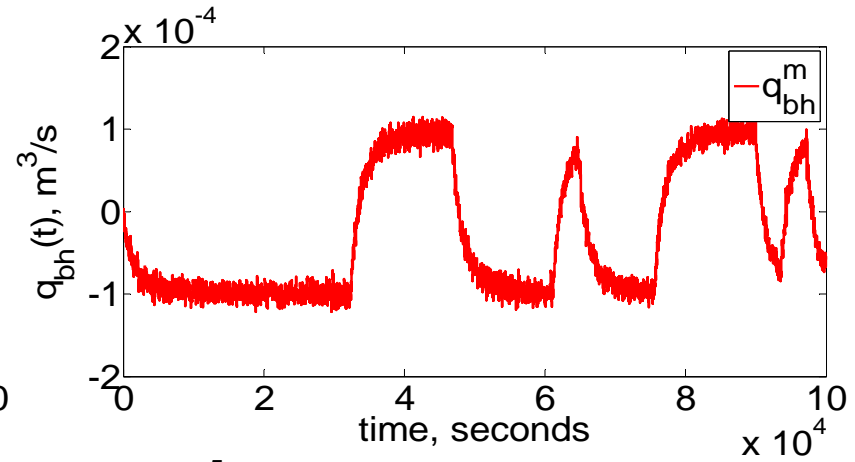
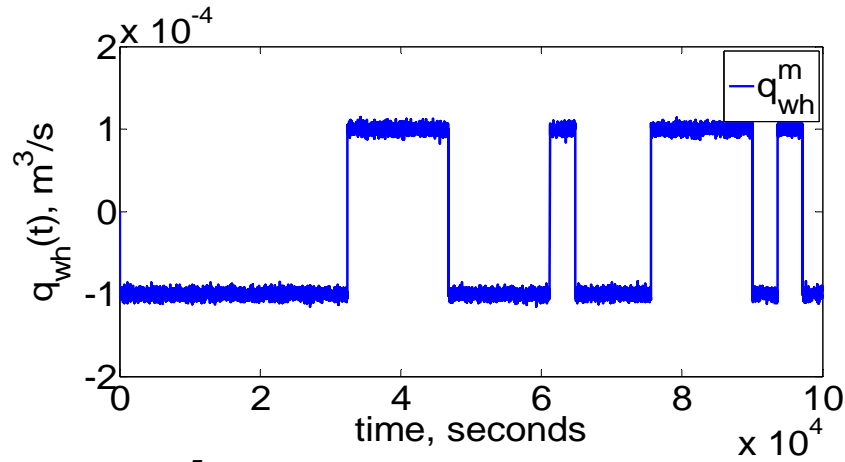
$$R_{\varepsilon z}(\tau, \theta) = H^{-1}(q, \theta) \left(A_{21}(q)R_{q_{bh}^m z} - G(q, \theta)R_{q_{bh}^m z} \right) + \bar{E} [H^{-1}(q, \theta)H^0(q)e(t)z(t - \tau)]$$

Thus $\{A_{21}(q^{-1}) = G(q, \theta) \& H(q, \theta) = H^0(q)\}$ iff $R_{\varepsilon z}(\tau, \theta) = 0, \tau \geq 0$

Hence by having $V_N(\theta^*) = \frac{1}{N} \sum_{\tau=0}^{N-1} R_{\varepsilon z}^2(\tau, \theta^*) = 0$ then $R_{\varepsilon z}(\tau, \theta^*) = 0$

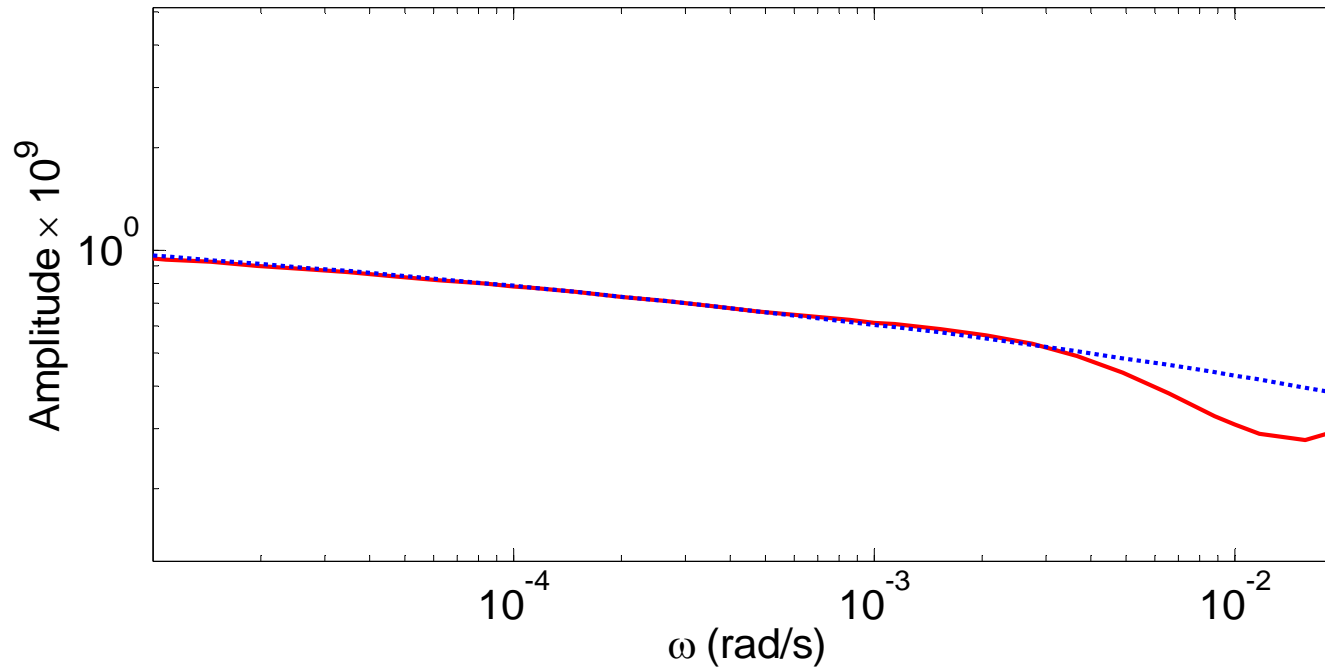
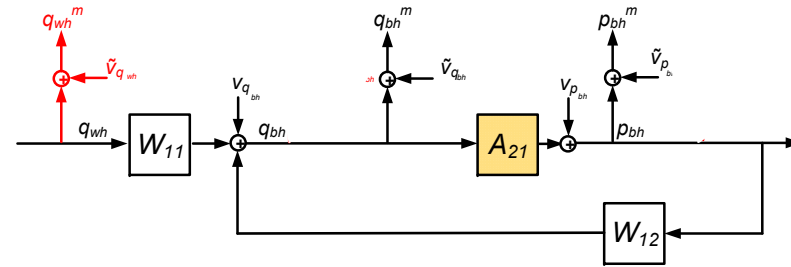
and consequently $A_{21}(q^{-1}) = G(q, \theta^*)$.

Case Studies:



Case 1: Using q_{wh}^m

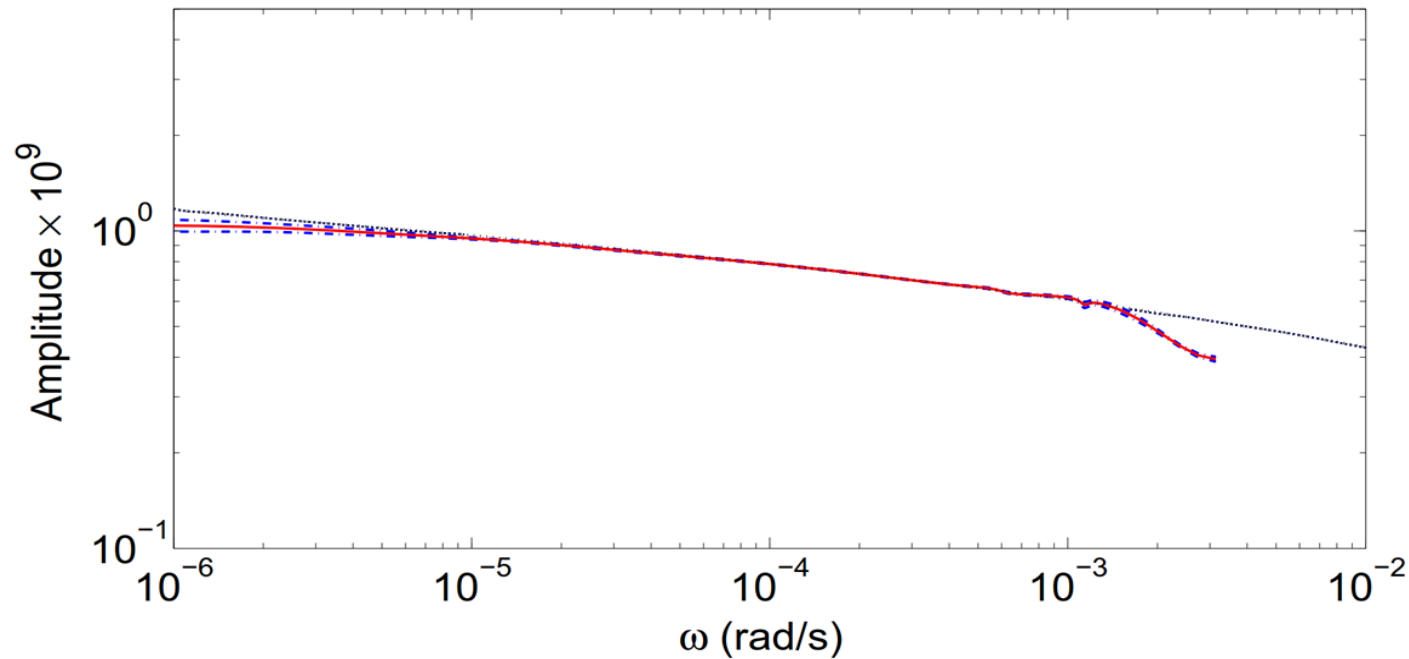
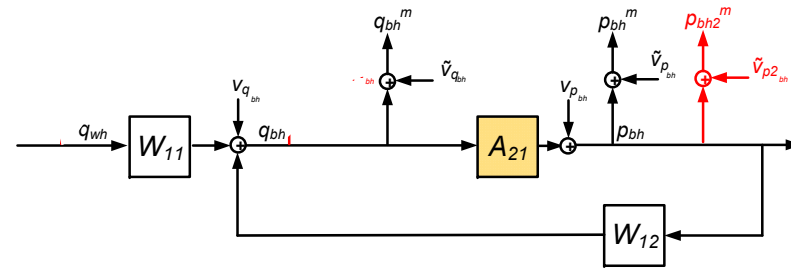
Instrumental variable $z = q_{wh}^m$
 Identified model = OE(660)



Amplitude plot of the identified plant model,
 red: identified model, dotted-blue: data generating system ($k=200$ mD, $S=0$)

Case 2: Using p_{bh}^m

Instrumental variable $z = p_{bh}^m$
 Identified model = BJ(9 9 9 10 0)

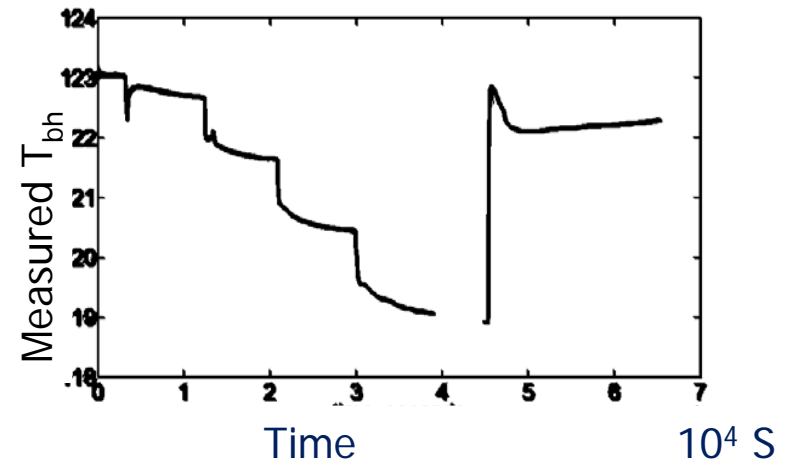
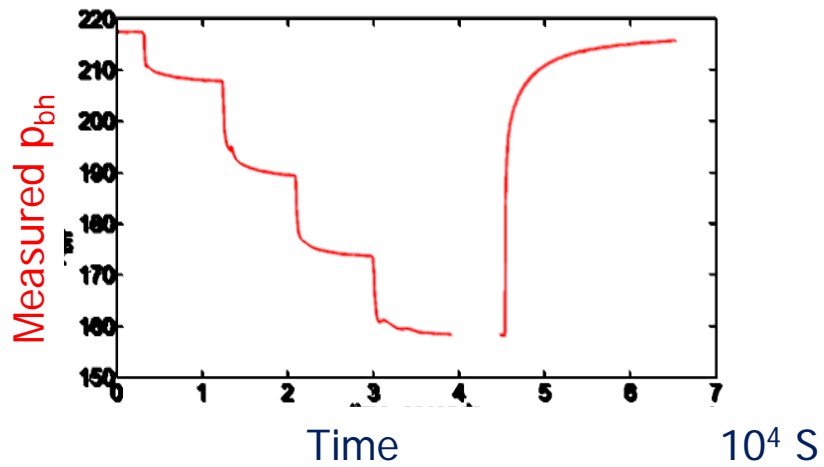
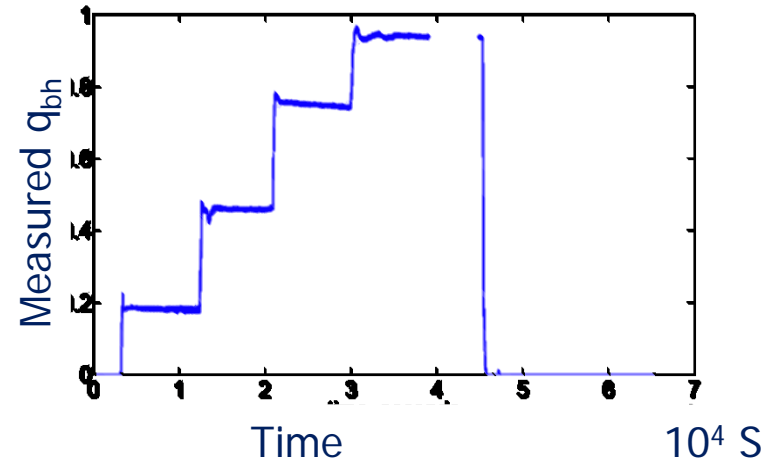
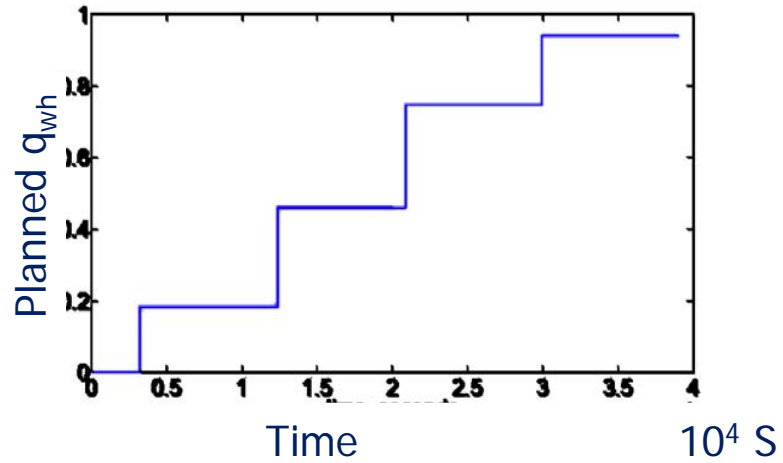


Amplitude plot of the identified plant model
 red: identified model, dotted-blue: data generating system (k=200 mD, S=0)

Physical Parameters Estimation

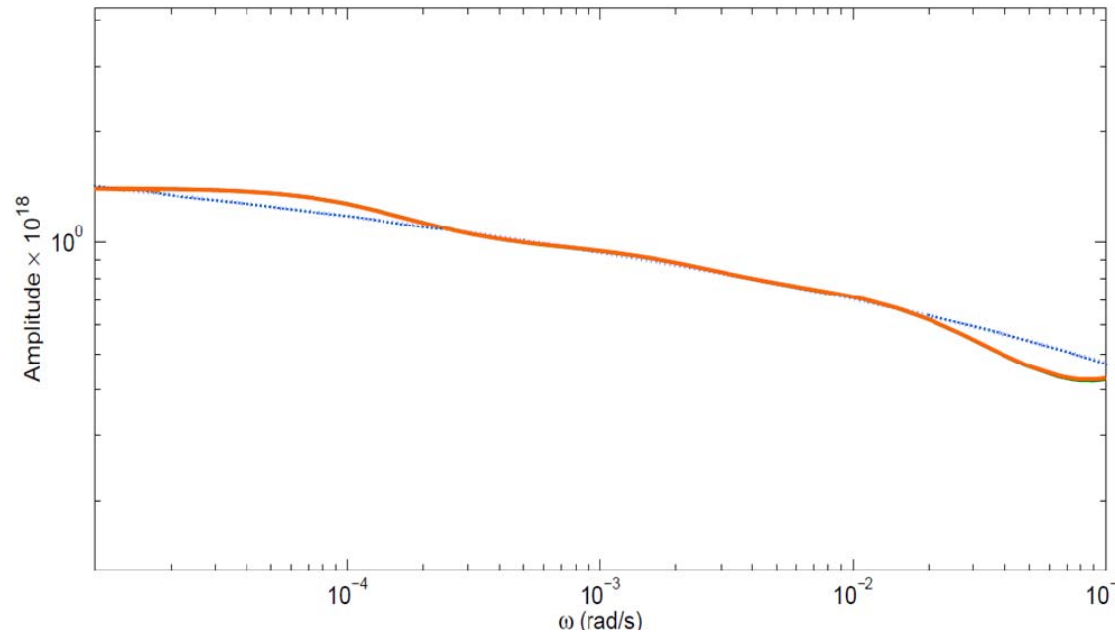
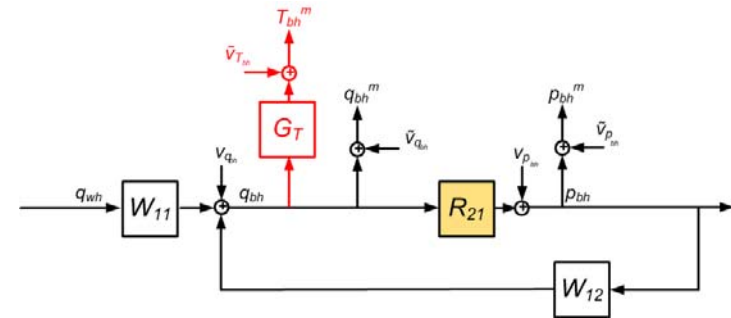
	Physic-based model	Data-based model
Time-domain	PDE equations	discrete-time data
Complex-domain	$A_{21}(s) = A_{21}(s, k, S)$	$\hat{G}_{ss}(z, \hat{\theta}_N) = \frac{B(z, \hat{\theta}_N)}{F(z, \hat{\theta}_N)}$
Frequency-domain	$A_{21}(j\omega, k, S)$	$\hat{G}_{ss}(e^{j\omega}, \hat{\theta}_N)$
Misfit criterion	$\beta = \frac{1}{L} \operatorname{argmin}_{\beta} \sum_{l=1}^L \ A_{21}(\beta, j\omega_l) - \hat{G}_{ss}(e^{j\omega}, \hat{\theta}_N)\ ^2 W(\omega_l)$	
Results	Permeability k & Skin factor S	

Results: Field Data



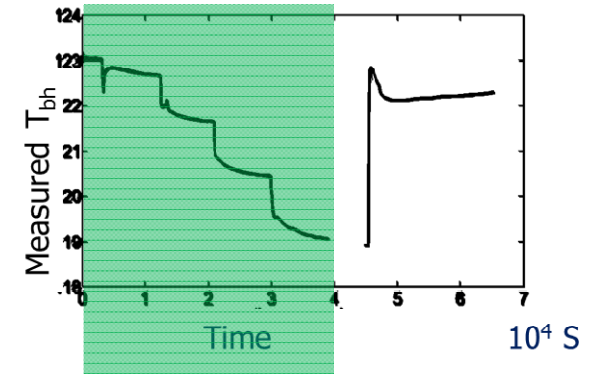
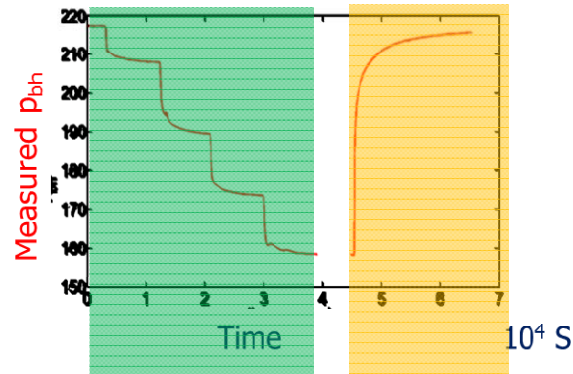
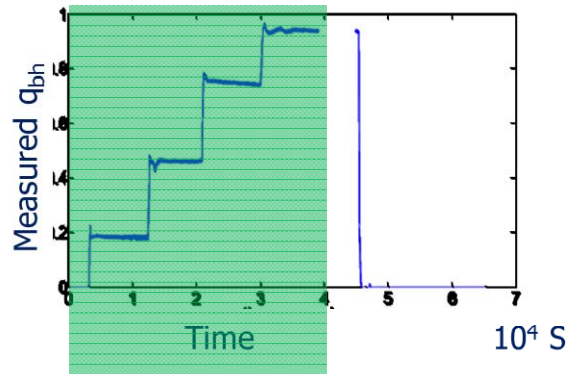
Identified Model

Instrumental variable $z = T_{bh}^m$
 Identified model = BJ(6 6 7 8 0)



Amplitude plot of the identified plant model
 orange: identified model,
 dotted-blue: estimated physics-based model (k=15.8 mD, S=-1.4)

Physical Parameter Estimates



Identified model
using EIVIV

k

S

15.8 mD

-1.4

Conventional
Well test analysis

k

S

11 mD

-2.6

Results are in good correspondence with each other.

Discussion and Conclusions

- ❑ Well model identification can be described as a closed-loop EIV identification problem.
- ❑ This allows well testing on the basis of general data (no need for shut-in)
- ❑ Different auxiliary measured signals can be used for solving the identifiability issue in well testing using the very powerful method of EIVIV.



THANKS FOR YOUR ATTENTION.