

Innovation and Creativity

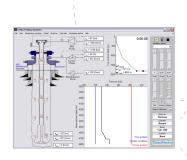
Adaptive Observer Design for the Bottomhole Pressure of a Managed Pressure Drilling System CDC - Cancun

Øyvind Nistad Stamnes, Jing Zhou, Glenn-Ole Kaasa, Ole Morten Aamo Department of Engineering Cybernetics 10 Dec. 2008

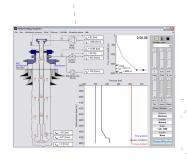
StatoilHydro



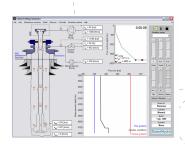
Drilling 101

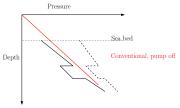


- Drilling 101
- System Model

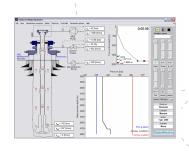


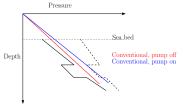
- Drilling 101
- System Model
- Observer Design



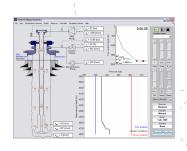


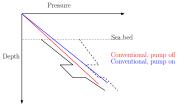
- Drilling 101
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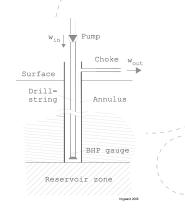
- Drilling 101
- System Model
- Observer Design
- Simulation Results







Conventional Drilling



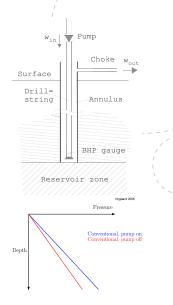
Conventional Drilling

 $P_{ann} = P_{fric} + P_{hydro}$

 $P_{ann} = Annular pressure$

 P_{fric} = Friction pressure

 P_{hydro} = Hydrostatic pressure



- Conventional Drilling
- Managed Pressure Drilling (MPD)

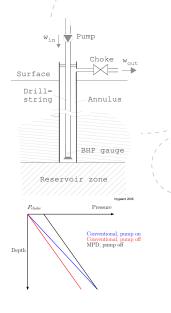
$$P_{ann} = P_{fric} + P_{hydro} + P_{choke}$$

 $P_{ann} = Annular pressure$

 P_{fric} = Friction pressure

 P_{hydro} = Hydrostatic pressure

 P_{choke} = Pressure upstream choke



- Conventional Drilling
- Managed Pressure Drilling (MPD)

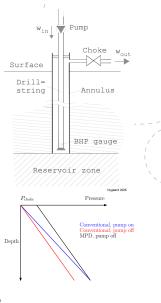
$$P_{ann} = P_{fric} + P_{hydro} + P_{choke}$$

 $P_{ann} = Annular pressure$

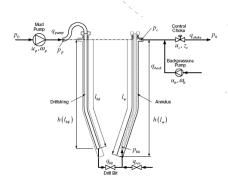
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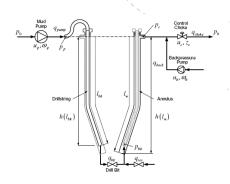
 P_{choke} = Pressure upstream choke



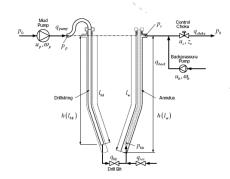




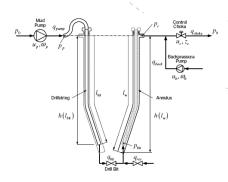
 1. phase, effect of gas in well included in density and effective bulk modulus



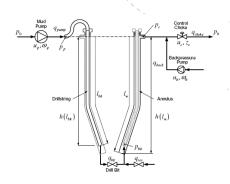
- 1. phase, effect of gas in well included in density and effective bulk modulus
- Rigid flow in momentum balance



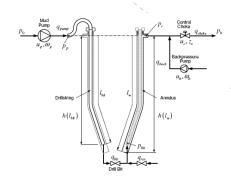
- 1. phase, effect of gas in well included in density and effective bulk modulus
- Rigid flow in momentum balance
- Turbulent flow regime

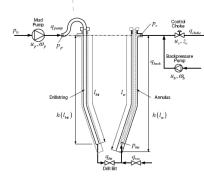


- 1. phase, effect of gas in well included in density and effective bulk modulus
- Rigid flow in momentum balance
- Turbulent flow regime
- 1-dimensjonal flow



- 1. phase, effect of gas in well included in density and effective bulk modulus
- Rigid flow in momentum balance
- Turbulent flow regime
- 1-dimensjonal flow
- Isothermal conditions

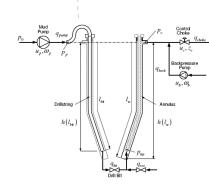




$$p=[\text{bar}], \ V=[m^3], \ q=\left[\frac{m^3}{s}\right]$$

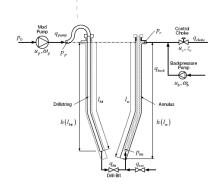
 $\beta=[\text{bar}], \ h=[m], \ g=9.81\left[\frac{m}{s^2}\right]$
 $F=\text{friction factor}, \ \rho=\left[\frac{kg}{m^3}\right]$

$$rac{V_a}{eta_a}\dot{p}_c+\dot{V}_a=q_{bit}+q_{back}+q_{res}-q_{choke}$$



$$p$$
=[bar], V =[m^3], q = $\left[\frac{m^3}{s}\right]$ β =[bar], h =[m], g =9.81 $\left[\frac{m}{s^2}\right]$ F =friction factor, ρ = $\left[\frac{kg}{m^3}\right]$

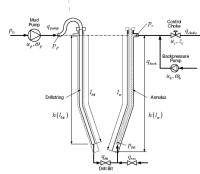
$$rac{V_a}{eta_a}\dot{p}_c+\dot{V}_a=q_{bit}+q_{back}+q_{res}-q_{choke} \ rac{V_d}{eta_d}\dot{p}_p=q_{pump}-q_{bit}$$



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$$egin{aligned} rac{V_a}{eta_a} \dot{p}_c + \dot{V}_a &= q_{bit} + q_{back} + q_{res} - q_{choke} \ rac{V_d}{eta_d} \dot{p}_p &= q_{pump} - q_{bit} \ M \dot{q}_{bit} &= p_p - p_c - (F_d + F_a) |q_{bit}| q_{bit} \ &+ (
ho_d -
ho_a) q h_{bit} \end{aligned}$$



$$p=[\text{bar}], \ V=[m^3], \ q=\left\lceil\frac{m^3}{s}\right\rceil$$

$$\beta=[\text{bar}], \ h=[\text{m}], \ g=9.81\left\lceil\frac{m}{s^2}\right\rceil$$

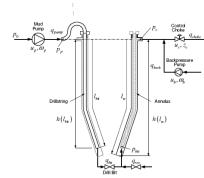
$$F=\text{friction factor}, \ \rho=\left\lceil\frac{kg}{m^3}\right\rceil$$

$$M=M_d+M_a$$

$$M_d=\rho_d\int_0^{l_{bit}}\frac{1}{A_d(x)}dx,$$

$$M_a=\rho_a\int_0^{l_w}\frac{1}{A_d(x)}dx$$

$$egin{aligned} rac{V_a}{eta_a} \dot{p}_c + \dot{V}_a &= q_{bit} + q_{back} + q_{res} - q_{choke} \ rac{V_d}{eta_d} \dot{p}_p &= q_{pump} - q_{bit} \ M \dot{q}_{bit} &= p_p - p_c - (F_d + F_a) |q_{bit}| q_{bit} \ &+ (
ho_d -
ho_a) g h_{bit} \ p_{bit} &= \left\{ egin{aligned} p_c + M_a \dot{q}_{bit} + F_a |q_{bit}| q_{bit} +
ho_a g h_{bit} \ p_p + M_d \dot{q}_{bit} - F_d |q_{bit}| q_{bit} +
ho_d g h_{bit} \end{aligned}
ight.$$



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Model-Verification



Model-Verification

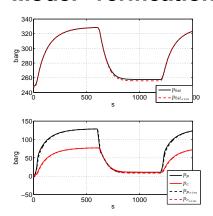


Figure: Model fitted to WeMod

Model-Verification

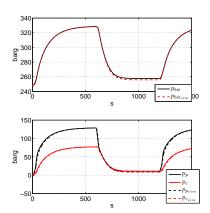


Figure: Model fitted to WeMod

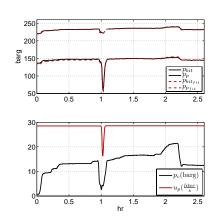
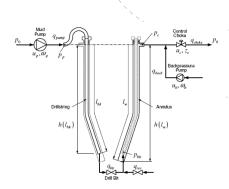
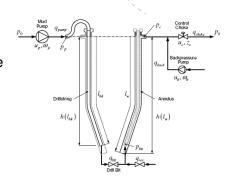


Figure: Model fitted to data

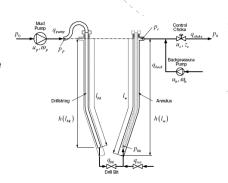
 Measure top-side pressures and flow through main pump



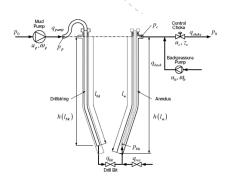
- Measure top-side pressures and flow through main pump
- measure/know the geometry of the well



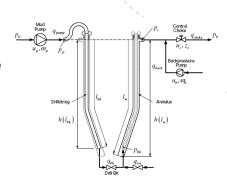
- Measure top-side pressures and flow through main pump
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- all parameters except friction and density in annulus known



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- $-q_{res} = 0$



- Measure top-side pressures and flow through main pump
- measure/know the geometry of the well
- all parameters except friction and density in annulus known
- $-q_{res} = 0$
- $q_{bit} > 0$, in reality $q_{bit} \ge 0$



$$\dot{p}_p = -a_1 q_{bit} + b_1 u_p$$

$$a_1 = \frac{\beta_d}{V_d}, \qquad b_1 = a_1$$

$$\dot{p}_{p} = -a_{1}q_{bit} + b_{1}u_{p} \ \dot{q}_{bit} = a_{2}(p_{p} - p_{c}) - \theta_{1}|q_{bit}|q_{bit} + \theta_{2}v_{3}$$

$$a_1 = \frac{\beta_d}{V_d},$$
 $b_1 = a_1$ $a_2 = \frac{1}{M},$ $\theta_1 = \frac{F_a + F_d}{M}$

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 $p_{bit} = p_{c} + M_{a}\dot{q}_{bit} + (M\theta_{1} - F_{d})q_{bit}^{2} + (\rho_{d} - \frac{M}{g}\theta_{2})h_{bit}$

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Define $\xi = q_{bit} + l_1 p_p$. l_1 is a tuning gain.

9

Observer Design - Transformation

Define $\xi = q_{bit} + l_1 p_p$. l_1 is a tuning gain. Dynamics for ξ

$$\dot{\xi} = -l_1 a_1 q_{bit} - \theta_1 |q_{bit}| q_{bit} + \theta_2 v_3 + a_2 (p_p - p_c) + l_1 b_1 u_p$$

Oha

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A state estimator for q_{bit}

$$\dot{\widehat{\xi}} = -I_1 a_1 \widehat{q}_{bit} - \widehat{\theta}_1 |\widehat{q}_{bit}| \widehat{q}_{bit} + \widehat{\theta}_2 v_3 + a_2 (p_p - p_c) + I_1 b_1 u_p
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Error dynamics for $\widetilde{\xi} = q_{bit} - \widehat{q}_{bit}$

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—
$$V = \frac{1}{2}\tilde{\xi}^2 + \frac{1}{2}\tilde{\theta}^T\Gamma^{-1}\tilde{\theta}$$

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$$-\dot{V} \leq -I_1 a_1 \tilde{\xi}^2$$

— for the choice
$$\dot{\tilde{\theta}} = -\Gamma \phi \tilde{\xi}$$

Lyapunov type analysis

$$-V = \frac{1}{2}\tilde{\xi}^2 + \frac{1}{2}\tilde{\theta}^T \Gamma^{-1}\tilde{\theta}$$

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$$|\mathit{V}| \leq \mathit{V}_0$$
 which gives $|\tilde{\xi}| < \mathit{c}_1$ og $|\tilde{ heta}| < \mathit{c}_2$

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- Using Barbălat's lemma we get $\lim_{t \to \infty} ilde{\xi} = \lim_{t \to \infty} ilde{q}_{bit} = 0$

Lyapunov type analysis

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- We also get $\lim_{t\to\infty} \tilde{\theta}^T \phi = \lim_{t\to\infty} \left(-\tilde{\theta}_1 \widehat{q}_{\textit{bit}} + \tilde{\theta}_2 \textit{v}_3 \right) = 0$

Lyapunov type analysis

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- $\tilde{q}_{bit} \to 0$ og $\tilde{\theta}^T \phi \to 0$ enables us to get an estimate $\hat{p}_{bit} \to p_{bit}$

Problem: $\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$

11

Observer Design - Adaptive law

Problem: $\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$

Define: $\sigma = \theta + \eta(\widehat{q}_{bit}, v_3)$ and differentiate w.r.t. time

11

Observer Design - Adaptive law

Problem: $\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$

Define: $\sigma = \theta + \eta(\hat{q}_{bit}, v_3)$ and differentiate w.r.t. time

$$\dot{\sigma} = \frac{\partial \eta}{\partial \widehat{q}_{bit}} (\dot{\widehat{\xi}}_1 - I_1(-a_1 q_{bit} + b_1 u_p)) + \frac{\partial \eta}{\partial v_3} \dot{v}_3$$

Problem:
$$\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$$

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Let an estimate $\widehat{\theta}$ be:

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Problem: $\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$

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$$\begin{split} \widehat{\theta} &= \widehat{\sigma} - \eta(\widehat{q}_{bit}) \\ \dot{\widehat{\sigma}} &= \frac{\partial \eta}{\partial \widehat{q}_{bit}} (\widehat{\xi}_1 - I_1(-a_1 \widehat{q}_{bit} + b_1 u_p)) + \frac{\partial \eta}{\partial v_3} \dot{v}_3 \end{split}$$

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Let an estimate $\widehat{\theta}$ be:

$$\widehat{\theta} = \widehat{\sigma} - \eta(\widehat{q}_{bit})
\dot{\widehat{\sigma}} = \frac{\partial \eta}{\partial \widehat{q}_{bit}} (\widehat{\xi}_1 - I_1(-a_1 \widehat{q}_{bit} + b_1 u_p)) + \frac{\partial \eta}{\partial v_3} \dot{v}_3$$

Observe that $\tilde{\sigma} = \tilde{\theta}$ og $\dot{\tilde{\theta}} = \dot{\tilde{\sigma}} = I_1 a_1 \frac{\partial \eta}{\partial \hat{q}_{bit}} \tilde{q}_{bit}$.

Problem: $\dot{\hat{\theta}} = -\dot{\tilde{\theta}} = \Gamma \phi \tilde{\xi}$

Define: $\sigma = \theta + \eta(\hat{q}_{bit}, v_3)$ and differentiate w.r.t. time

$$\dot{\sigma} = \frac{\partial \eta}{\partial \widehat{q}_{bit}} (\hat{\widehat{\xi}}_1 - I_1(-a_1 q_{bit} + b_1 u_p)) + \frac{\partial \eta}{\partial v_3} \dot{v}_3$$

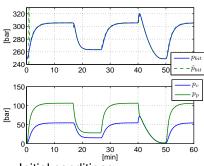
Let an estimate $\widehat{\theta}$ be:

$$\begin{split} \widehat{\theta} &= \widehat{\sigma} - \eta(\widehat{q}_{bit}) \\ \dot{\widehat{\sigma}} &= \frac{\partial \eta}{\partial \widehat{q}_{bit}} (\widehat{\xi}_1 - I_1(-a_1 \widehat{q}_{bit} + b_1 u_p)) + \frac{\partial \eta}{\partial v_3} \dot{v}_3 \end{split}$$

Observe that $\tilde{\sigma} = \tilde{\theta}$ og $\dot{\tilde{\theta}} = \dot{\tilde{\sigma}} = I_1 a_1 \frac{\partial \eta}{\partial \hat{q}_{bit}} \tilde{q}_{bit}$.

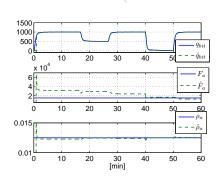
Solve pde: $I_1 a_1 \frac{\partial \eta}{\partial \widehat{a}_{kit}} = -\Gamma \phi \widetilde{\xi}$

Simulation - WeMod

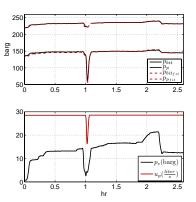


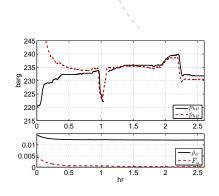


$$\hat{q}_{bit}(t_0) = u_p(t_0), \, \hat{\rho}_a(t_0) = 2\rho_a, \\ \hat{F}_a(t_0) = 3F_a, \, t_0 = 50s$$



Simulation - Data





Initial conditions:

$$\hat{q}_{bit}(t_0) = u_p(t_0), \ \hat{\rho}_a(t_0) = 1.2\rho_a, \ \hat{F}_a(t_0) = 1.5F_a$$

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Thank you!



StatoilHydro