

# System Identification 07 - Grey box models

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## 1 Activity

- Rodar o código de identificação do EMPS fornecido e analisar linha por linha o funcionamento.
- Trocar o modelo de Coulomb pelo modelo de Tustin (eq 10 do artigo abaixo):  
[https://www.sba.org.br/open\\_journal\\_systems/index.php/cba/article/view/1570](https://www.sba.org.br/open_journal_systems/index.php/cba/article/view/1570)  
Comparar os resultados: Coulomb vs. Tustin (em termos de erro, parâmetros identificados, etc)
- Caso tenham interesse em se aprofundar nos modelos de atrito, podem testar com demais opções no artigo de revisão abaixo:  
<https://link.springer.com/content/pdf/10.1007/s11071-016-2999-3.pdf>  
Sugiro tentar o Luge (secao 3.5 deste artigo) - atividade extra (para os interessados).

## 2 Code Changes

In order to use the Tustin model for the friction force as proposed, the torque expression changes from equation 1 to equation 2 described below:

Torque expression using Coulomb friction force model:

$$\tau(t) = M\ddot{q}(t) + F_v\dot{q}(t) + F_c\text{sign}(\dot{q}(t)) + offset \quad (1)$$

Torque expression using Tustin friction force model:

$$\tau(t) = M\ddot{q}(t) + F_v\dot{q}(t) + F_c\text{sign}(\dot{q}(t)) + (F_s - F_c)e^{-\frac{|\dot{q}|}{v_s}} + offset \quad (2)$$

Parameters and  $\dot{x}_2 = \ddot{q}$  expresion on the state vector:

```
1      Mn      = MX.sym( 'Mn' );
2      Fvn     = MX.sym( 'Fvn' );
3      Fcn     = MX.sym( 'Fcn' );
4      Fsn     = MX.sym( 'Fsn' );
5      vsn     = MX.sym( 'vsn' );
6      ofstn   = MX.sym( 'ofstn' );
7
8      params   = [Mn;Fvn;Fcn;Fsn;vsn;ofstn];
9      parammax = [150; 300; 40; 40; 1e-3; 15];
10     parammin = [ 30; 100;  0;  0; 1e-4; -15];
11
12     % rhs = [dq; (u-Fv*dq-Fc*sign(dq)-ofst)/M];
13     rhs = [dq; (u-Fv*dq-Fc*sign(dq)+(Fc-Fs)*exp(-(abs(dq))/vs)-ofst)/M];
```

The range for the  $v_s$  parameter was based on the respective value given by the IDIM model ( $v_s = 0.006464$ ). The rest of the code is kept exactly the same.

### 3 Results

After performing the grey box identification using the casadi library, we compare the parameters values estimated by the inverse dynamic model (IDM) and the grey box casadi model. The values of the estimated parameters, for both the Coulomb and the Tustin friction forces are shown in tables 1 and 2.

**Table 1:** Coulomb Model parameters

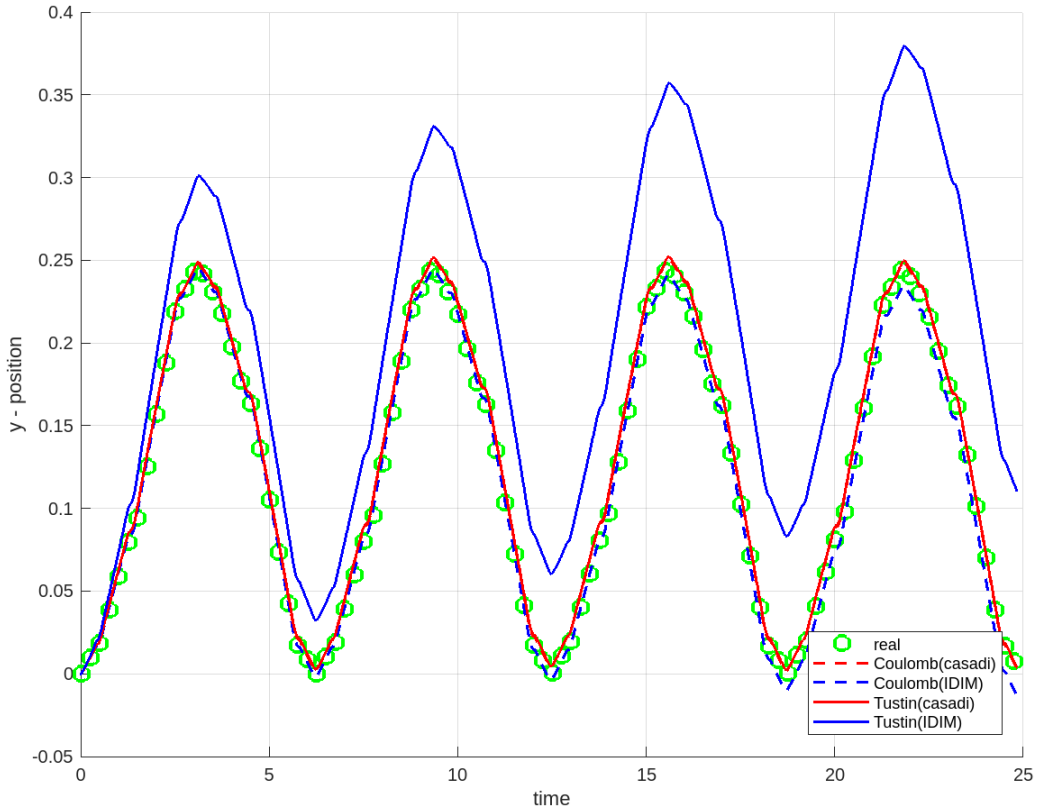
Model	M	Fv	Fc	ofst
casadi	95.1089	203.5034	20.3935	-3.1648
IDIM	96.0014	213.8943	19.4167	-3.2790

**Table 2:** Tustin Model parameters

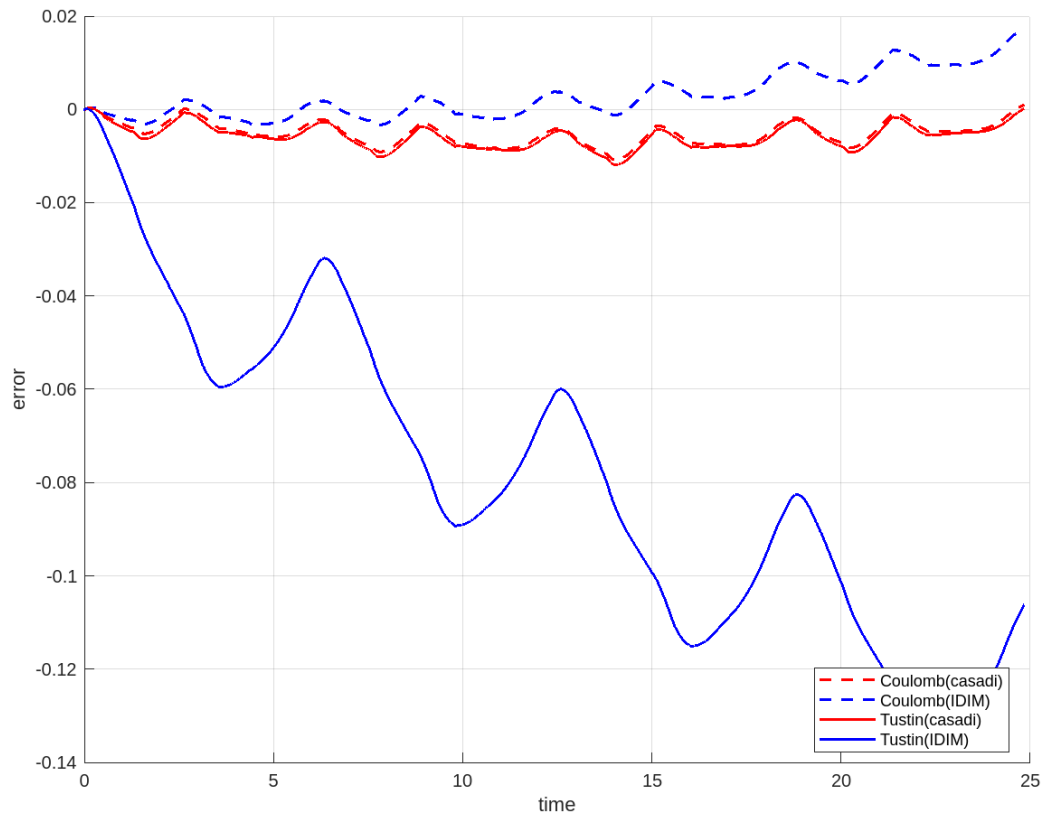
Model	M	Fv	Fc	Fs	vs	ofst
casadi	97.001	222.01	18.606	36.3311	0.000900	-3.29
IDIM	95.681	203.36	17.023	17.0230	0.006464	-4.12

The simulated responses and the associated errors, for both force models (Coulomb and Tustin) and parameters estimation methods (casadi and IDIM) are shown in figures 1 and 2.

As we can notice, casadi models estimate have a good fit for both force models, while IDIM models have a poor performance (higher error) when estimating the Tustin force model parameters.



**Figure 1:** Position (y) - real and estimated data



**Figure 2:** Error between estimated and real data