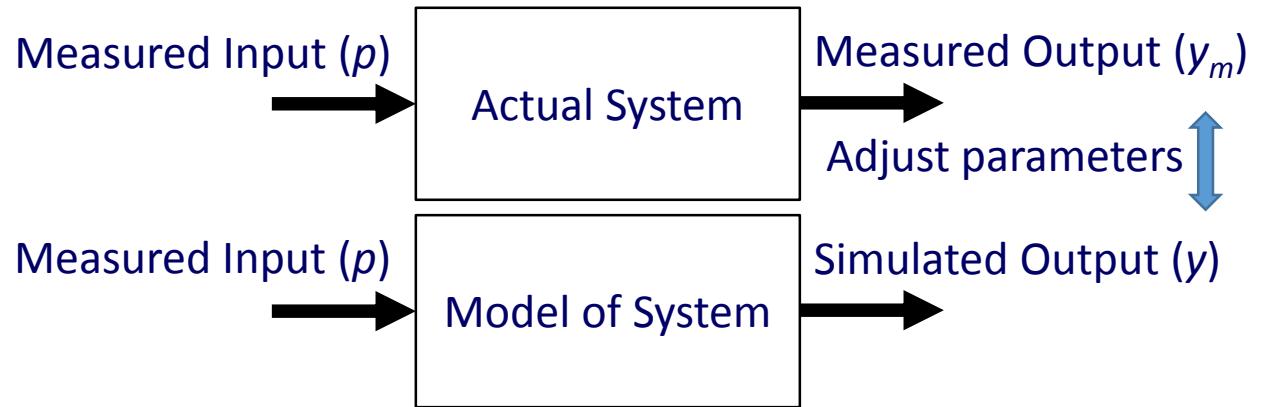


Part II: Dynamic Estimation

- Dynamic Modeling
 - Empirical
 - Fundamental
- **Dynamic Estimation**
- Dynamic Control



$$\begin{aligned} & \text{minimize} && \|y_m - y\|_n \\ & \text{subject to} && 0 = f\left(\frac{dx}{dt}, x, y, p\right) \\ & && 0 \leq g\left(\frac{dx}{dt}, x, y, p\right) \end{aligned}$$

Data for Empirical Modeling

- Linear first-order equation
 - $\tau \frac{dv}{dt} = -v + K p$
- Gain (K)
 - Change in output / Change in input with $K = \frac{\Delta v}{\Delta p} = \frac{v_2 - v_1}{p_2 - p_1}$
 - Points 1 and 2 at steady state, $\frac{dv}{dt} = 0 = -v + K p$ or $v = K p$
 - Point 1: $p_1 = 0, v_1 = 0$ (at rest)
 - Point 2: $p_1 = 20, v_1 = 0$
- Time constant (τ)
 - Step change in the input
 - Time to reach 63.2% of steady state value

Why is τ the time for 63.2% to steady-state?

Separate and Integrate

$$\tau \frac{dv}{dt} = -v + K p$$

$$\int_0^v \frac{\tau}{Kp - v} dv = \int_0^t dt$$

$$-\tau \ln\left(\frac{Kp - v}{Kp}\right) = t$$

$$v(t) = Kp (1 - e^{-t/\tau})$$

$$v(\tau) = Kp (1 - e^{-\tau/\tau}) \text{ with } t=\tau$$

$$v(\tau) = Kp (0.632)$$

$$v(\infty) = Kp \quad \text{at steady state}$$

Laplace Transforms

$$\tau \frac{dv}{dt} = -v + K p$$

$$\tau s V(s) - v(0) = -V(s) + K P(s)$$

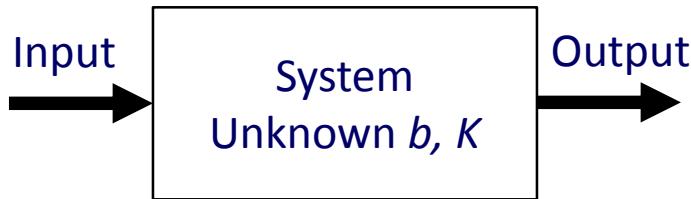
$$\boxed{\frac{V(s)}{P(s)} = \frac{K}{\tau s + 1}} \quad \text{Transfer Function}$$

$$V(s) = \frac{1}{s} \left(\frac{K p}{\tau s + 1} \right) \quad P(s) = p/s \text{ (step function)}$$

$$v(t) = Kp \left(1 - e^{-\frac{t}{\tau}} \right) \quad \text{Inverse Laplace Transform}$$

$$v(\tau) = Kp \left(1 - e^{-1} \right) = Kp(0.632) \quad \text{At } t = \tau$$

Dynamic Estimation in Excel



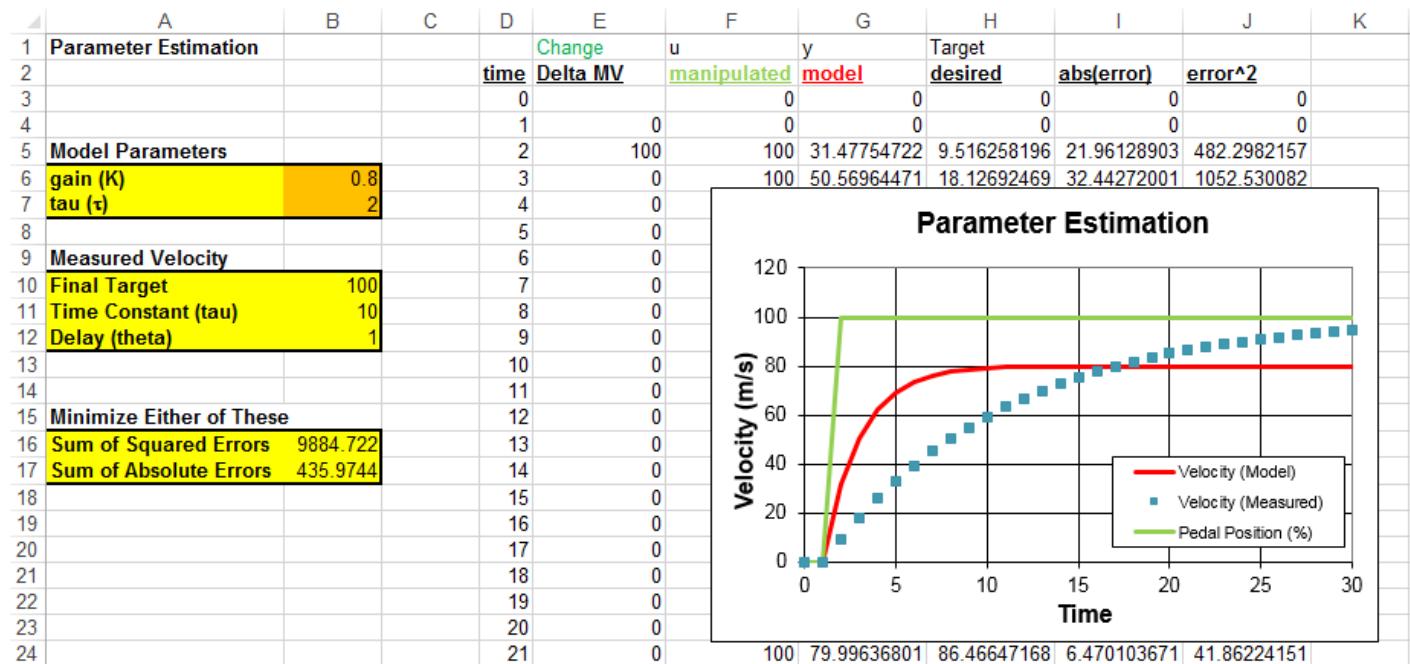
minimize
 K, τ

$$(v_m - v)^2$$

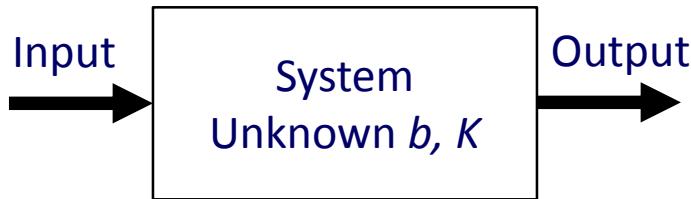
s.t.

$$\tau \frac{dv}{dt} = -v + K p$$

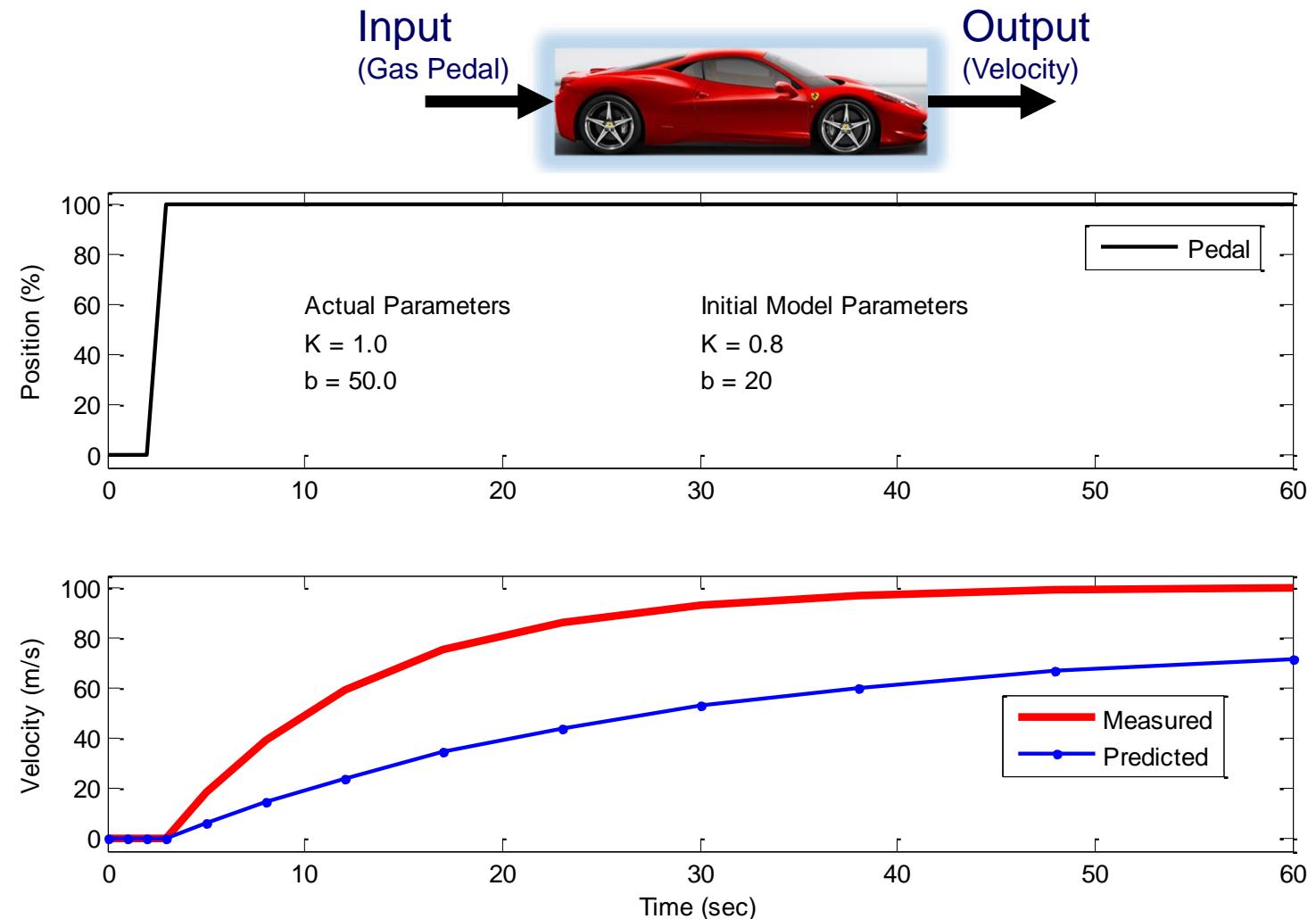
$$0 \leq b \leq 100$$



Dynamic Estimation in MATLAB



$$\begin{aligned} & \text{minimize}_{K,b} && (v_m - v)^2 \\ & \text{s.t.} && \frac{m}{b} \frac{dv}{dt} = -v + K p \\ & && 0 \leq b \leq 100 \end{aligned}$$



Dynamic Estimation in MATLAB

Setup

```
clear all; close all; clc % clear session
addpath('apm') % load APMonitor.com toolkit

% s = server, a = application
s = 'http://byu.apmonitor.com';
a = 'velocity';

% clear prior application
apm(s,a,'clear all');

% load model and data
apm_load(s,a,'ferrari.apm');
csv_load(s,a,'ferrari.csv');

% specify parameters
apm_info(s,a,'FV','K');
apm_info(s,a,'FV','b');
apm_info(s,a,'CV','v');
```

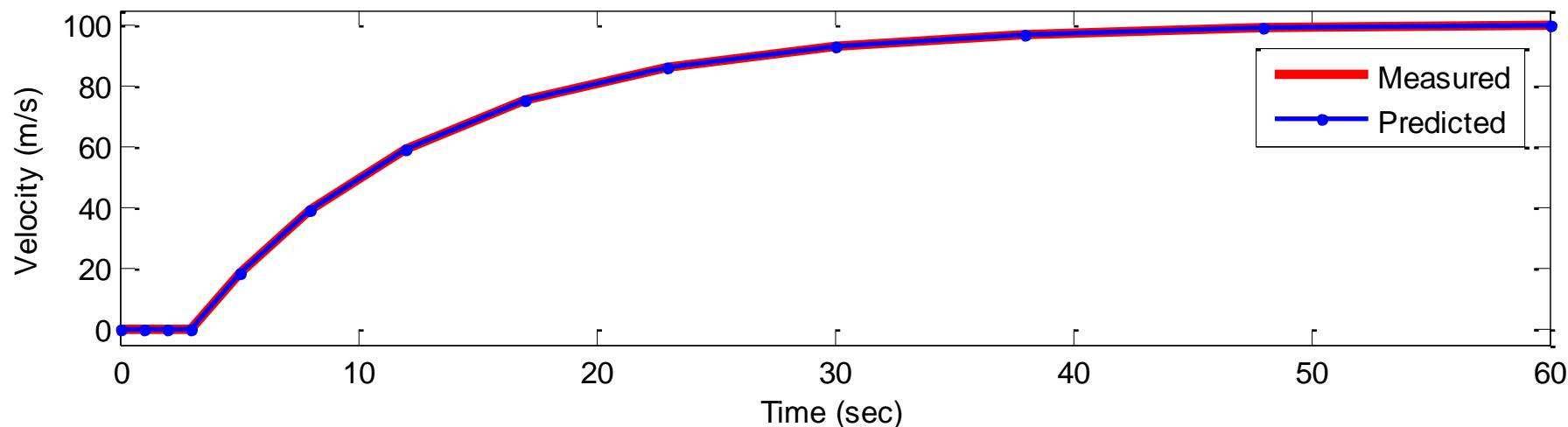
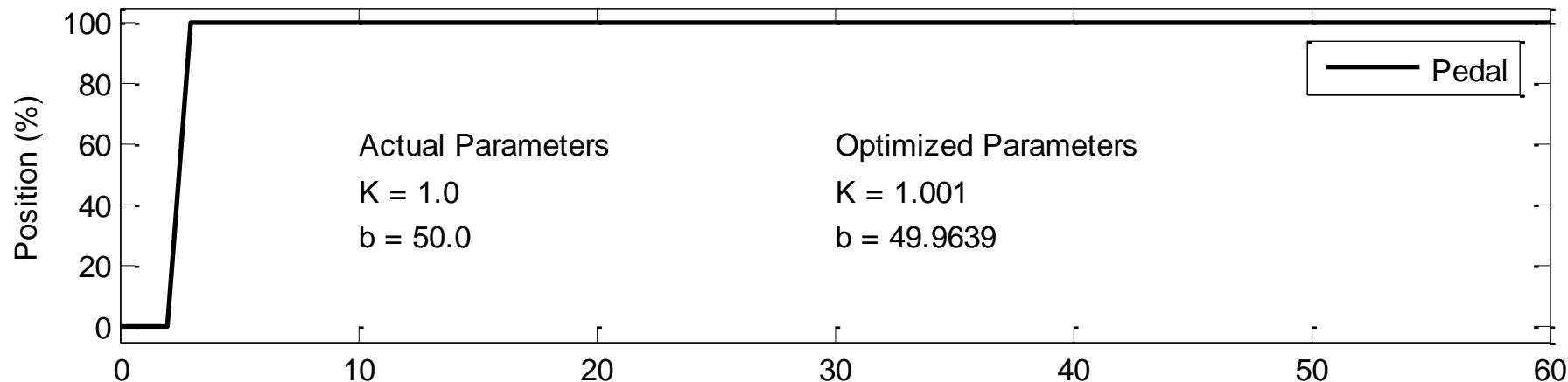
Tune and Solve

```
% configuration parameters
apm_option(s,a,'nlc.imode',5);
apm_option(s,a,'nlc.nodes',3);

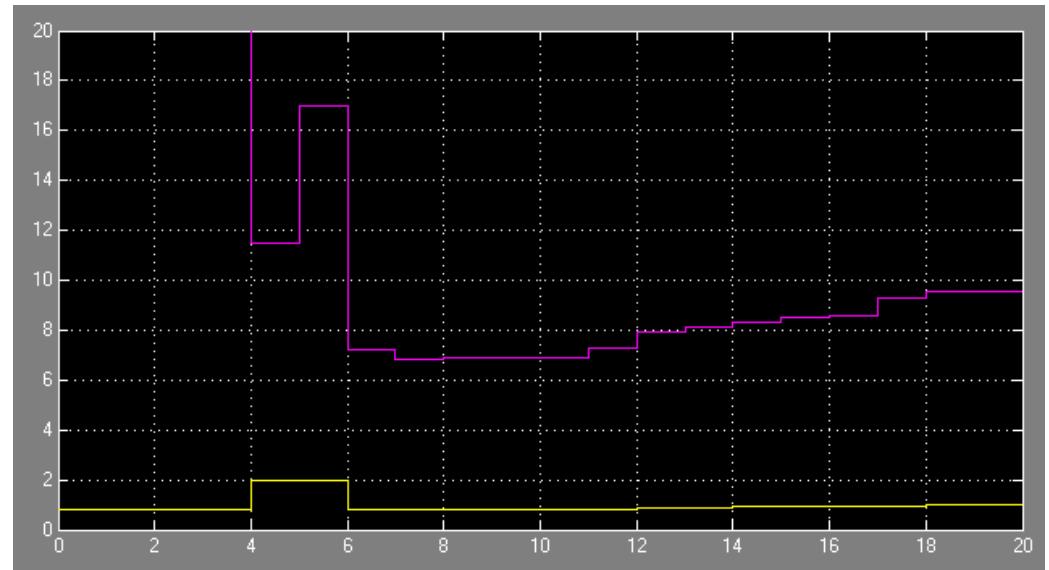
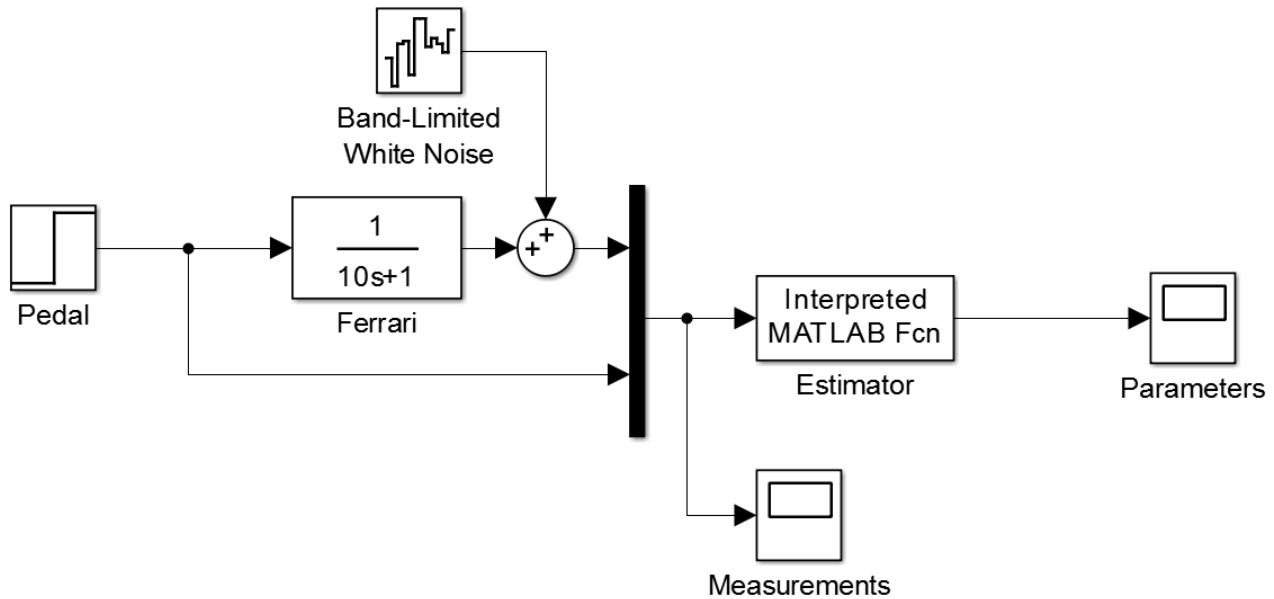
% solve and retrieve results
output = apm(s,a,'solve'); disp(output);
y = apm_sol(s,a); z = y.x;

% open web-viewer
apm_web(s,a);
```

Dynamic Estimation MATLAB Results



Dynamic Estimation in Simulink



Dynamic Estimation Contour Plot

