

```
In [1]: import matplotlib.pyplot as plt
import control as co
import pandas as pd
import numpy as np
import sympy as sp
import time

from sympy.abc import a, b, q, s, z, omega, zeta
from numpy.linalg import inv

In [2]: u, uc, vs, y, ys, Gs, Hz, Hq = sp.symbols('u(k),u_c(k),v(s),y(k),y(s),G(s),H(z),H(q)')
Ts = sp.symbols('T_s')

am1, am2, bm0, bm1 = sp.symbols('a_(m_1),a_(m_2),b_(m_0),b_(m_1)')
ao, a1, a2, b0, b1 = sp.symbols('a_o,a_1,a_2,b_0,b_1')
r0, s0, s1, t0, t1 = sp.symbols('r_0,s_0,s_1,t_0,t_1')

Gs_eq = sp.Eq(Gs, b/(s*(s + b)))
```

The model is given by  $G(s) = \frac{b}{s(b+s)}$ . To discretize,

$$G(z) = (1 - z^{-1})Z\left\{\frac{b}{s^2(s+b)}\right\}$$
$$G(z) = (1 - z^{-1})Z\left\{\frac{1}{s^2} - \frac{1}{bs} + \frac{1}{b(b+s)}\right\}$$
$$G(z) = (1 - z^{-1})\left(\frac{T_s^2}{(z-1)^2} - \frac{1}{b} \frac{z}{z-1} + \frac{1}{b} \frac{z}{z-e^{-bT_s}}\right)$$

```
In [3]: Gz_eq_Ts_b = sp.simplify(sp.expand((1-1/z)*(Ts*z/(z-1)**2 - z/(b*(z-1)) + z/(b*(z-sp.exp(-b*Ts))))))

num, den = sp.fraction(Gz_eq_Ts_b)
den_poly = sp.Poly(den, z)
mono_div = den_poly.coeffs()[0]
sp.Eq(Hz, sp.collect(sp.simplify(Gz_eq_Ts_b), z))
```

$$H(z) = \frac{-T_s b + z\left(T_s b e^{T_s b} - e^{T_s b} + 1\right) + e^{T_s b} - 1}{b\left(z^2 e^{T_s b} + z\left(-e^{T_s b} - 1\right) + 1\right)}$$

## Pulse Function

```
In [4]: radius = 38/2000 # 38 mm diameter to radius in m
mass = 4/7000 # grams per ball
area_ball = np.pi * radius**2
volume_ball = 4/3*np.pi*radius**3
density = 1.2 # kg/m^3
veq = 2.8 # m/s

Ts_val = 0.2
b_nom = 2*9.81*(mass*density*volume_ball)/(mass*veq)
```

```
In [5]: ## Example 3.1: since it has the same structure TF I used it to validate my approach, it's consistent
# sub_vals = [(Ts, Ts_val), (b, 1)]

## This is for our project
sub_vals = [(Ts, Ts_val), (b, b_nom)]

num_mono_z = sp.collect(num/mono_div, z).subs(sub_vals)
den_mono_z = sp.collect(den/mono_div, z).subs(sub_vals)

Hq_eq = sp.Eq(Hq, num_mono_z/den_mono_z)
Hq_eq
# np.roots(sp.Poly(num_mono_z).coeffs())
```

$$H(q) = \frac{0.0888233086497573z + 0.0575823297146081}{1.0z^2 - 1.26797180817817z + 0.267971808178173}$$

```
In [6]: n_coeffs_nom, d_coeffs_nom = sp.fraction(Hq_eq.rhs)
pulse_coeffs = sp.Poly(d_coeffs_nom).coeffs()[1:]
for bi in sp.Poly(n_coeffs_nom).coeffs():
    pulse_coeffs.append(bi)

zeros = np.roots(sp.Poly(n_coeffs_nom).coeffs())
poles = np.roots(sp.Poly(d_coeffs_nom).coeffs())
zeros[0]
```

Out[6]: -0.6482794954381095

This is a sanity check with the nominal values to check the stability of the zeros. Here, the zero is unstable for a nominal value of  $b = -0.6482794954381095$  and the poles are 1.0 and 0.26797180817817307.

## Control Parameter Derivation

Given that the zeros are unstable, the parameters are derived without zero cancelation.

Here we know from the compatability conditions that,

$$\deg A_m = \deg A = 2$$

$$\deg B_m = \deg B = 1$$

Since the zeros in  $B$  are stable then  $B^+ = q + \frac{b_1}{b_0}$  and  $B^- = b_0$

Then,

$$\deg A_o = \deg A - \deg B^+ - 1 = 2 - 1 - 1 = 0$$

Using the Diophantine equation we get,

$$AR^+ + b_0 S = A_o A_m$$

$$\text{Let } A_o = 1$$

Since the process is second order, then,

$$\deg R = \deg S = \deg T = 1,$$

with R being monic.

## Control Parameters

```
In [7]: # Process Values
_A = q**2 + a1*q + a2
_B = b0*q + b1
_Bplus = q + b1/b0
_Bminus = b0

# Model Values
_Am = q**2 + am1*q + am2
_Bm = _Am.subs(q, 1)*q
_Ao = ao

# Control Values
_R = q + r0
_S = s0*q + s1
_T = t0*q
```

Diophantine equation:

```
In [8]: diophantine = sp.Eq((_A*1 + b0*S), (_Ao*_Am))
dio_LHS_coeffs = sp.Poly(diophantine.lhs, q).coeffs()
dio_RHS_coeffs = sp.Poly(diophantine.rhs, q).coeffs()
```

```
In [9]: # for i in range(len(dio_LHS_coeffs)):
#     display((dio_LHS_coeffs[i], dio_RHS_coeffs[i]))
```

Finding  $s_0$

```
In [10]: _s0 = sp.solve(dio_LHS_coeffs[1] - dio_RHS_coeffs[1], s0)[0]
sp.Eq(s0, _s0)
```

$$s_0 = \frac{-a_1 + a_o a_{m_1}}{b_0}$$

Finding  $s_1$

```
In [11]: _s1 = sp.solve(dio_LHS_coeffs[2] - dio_RHS_coeffs[2], s1)[0]
sp.Eq(s1, _s1)
```

$$s_1 = \frac{-a_2 + a_o a_{m_2}}{b_0}$$

Finding T

```
In [12]: _t0 = _Ao*_Bm/b0
_t0
```

$$a_o q \left( a_{m_1} + a_{m_2} + 1 \right) b_0$$

```
In [13]: R = _Bplus
S = _s0*q + _s1
T = _Ao*_Bm/_Bminus

display(R)
display(S)
display(T)
```

$$q + \frac{b_1}{b_0}$$

$$\frac{q\left(-a_1 + a_o a_{m_1}\right)}{b_0} + \frac{-a_2 + a_o a_{m_2}}{b_0}$$

$$\frac{a_o q\left(a_{m_1} + a_{m_2} + 1\right)}{b_0}$$

## Control Action

```
In [14]: uk1, uck1, yk1 = sp.symbols('u(k-1),u_c(k-1),y(k-1)')
control_action = (sp.expand(sp.Eq((_R*u)/q, (_T*uc - _S*y)/q)))
control_action
control_subs = [(1/q*u, uk1), (1/q*uc, uck1), (1/q*y, yk1)]
control_action_sol = sp.Eq(u, sp.solve(control_action.subs(control_subs), u)[0])
control_action_sol.subs([(r0, b1/b0),
                        (s0, s0),
                        (s1, s1),
                        (t0, _t0),
                        (ao, 1)])
```

$$u(k) = -\frac{b_1 u(k-1)}{b_0} + \frac{q u_c(k)\left(a_{m_1} + a_{m_2} + 1\right)}{b_0} - \frac{y(k)\left(-a_1 + a_{m_1}\right)}{b_0} - \frac{y(k-1)\left(-a_2 + a_{m_2}\right)}{b_0}$$

## Simulation

### Process Deivation

$$y(k) = -a_1 y(k-1) - a_2 y(k-2) + b_0 u(k-1) + b_1 u(k-2) = \phi(t-1)^T \theta$$

where,

$$\phi(t-1) = [-y(k-1) \ -y(k-2) \ u(k-1) \ u(k-2)]^T$$

and

$$\theta = [a_1 \ a_2 \ b_0 \ b_1]^T$$

```
In [15]: final_time = 90
t = np.arange(0, final_time + Ts_val, Ts_val)
def reference_signal(end_time=final_time, Ts_func=Ts_val, lower_set=0.2, upper_set=0.1, period=30):
    uc_func = []
    time = np.arange(0, end_time + Ts_func, Ts_func)
    for _t in time:
        rat = 2*np.pi/period
        if np.sin(rat*_t) >= 0:
            uc_func.append(upper_set)
        else:
            uc_func.append(lower_set)
    return np.array(uc_func, float)
uc_val = reference_signal(0, float)
# plt.plot(np.arange(0, 60 + Ts_val, Ts_val), uc)
# plt.show()
```

```
In [16]: omega_n = 1
zeta = 1
std = 0
# std = 0.001
Bmz_tf, Am2_tf = co.tfdata(co.sample_system(co.tf([1], [1, 2*zeta*omega_n, omega_n**2]), method='zoh', Ts=Ts_val,
Am1 = Amz_tf[0][0][1]
Am2 = Amz_tf[0][0][2]
# AM1 = 2*zeta*omega_n
# AM2 = omega_n**2
AM_SUM = 1 + AM1 + AM2
A0 = np.array([1])
lam = 0.98
initial_P_weights = [10000]*4
# initial_P_weights = [100, 100, 10, 10]
theta = np.array(pulse_coeffs, float).reshape(4, -1)
```

```
In [17]: # Estimates k = 0
time_ns = time.time_ns()
theta_hat = np.array([-0.5, 0.5, 0.25, 0.25], float).reshape(4, -1) # 0: a1 1: a2 2: b0 3: b1
# theta_hat = np.array([-0.5, 0.5, 0.5, 0.5], float).reshape(4, -1)
# theta_hat = np.ones((4,1), float)
theta_arr = theta_hat
P = np.diag(initial_P_weights)
phi = np.zeros((4,1))

y_measure = (phi.T@theta + np.random.normal(0, std)).reshape(-1,)

r0_est = theta_hat[3]
s0_est = A0*AM1 - theta_hat[0]
s1_est = A0*AM2 - theta_hat[1]
t0_est = A0*AM_SUM

M = np.array([r0_est, s0_est, s1_est, t0_est], float).reshape(-1, 1)
N = np.array([-u_val[0], -y_measure[0], 0, uc_val[0]], float).reshape(M.shape)
u_val = 1/theta[2]*(N.T@M).reshape(-1,)

# Estimates k = 1
phi = np.array([-y_measure[0], 0, u_val[0], 0], float).reshape(-1,1) # phi of 0
K = P@phi@inv(lam + phi.T@P@phi)
y_measure = np.concatenate((y_measure,
                             (phi.T@theta + np.random.normal(0, std)).reshape(-1,))),
                             theta_hat = theta_hat + K@y_measure[-1] - phi.T@theta_hat)
theta_arr = np.concatenate((theta_arr,
                             theta_hat.reshape(-1, 1)), axis=1)
P = (np.eye(len(phi)) - K@phi.T) @P/lam

r0_est = theta_hat[3]
s0_est = A0*AM1 - theta_hat[0]
s1_est = A0*AM2 - theta_hat[1]
t0_est = A0*AM_SUM

M = np.array([r0_est, s0_est, s1_est, t0_est], float).reshape(-1, 1)
N = np.array([-u_val[0], -y_measure[1], -y_measure[0], uc_val[1]], float).reshape(M.shape)
u_val = np.concatenate((u_val,
                             1/theta[2]*(N.T@M).reshape(-1,)))

for k in range(2, len(t)):
    phi = np.array([-y_measure[k-1], -y_measure[k-2], u_val[k-1], u_val[k-2]], float).reshape(-1,1)
    K = P@phi@inv(lam + phi.T@P@phi)
    y_measure = np.concatenate((y_measure,
                             (phi.T@theta + np.random.normal(0, std)).reshape(-1,))),
                             theta_hat = theta_hat + K@y_measure[-1] - phi.T@theta_hat)
    theta_arr = np.concatenate((theta_arr,
                             theta_hat.reshape(-1, 1)), axis=1)
    P = (np.eye(len(phi)) - K@phi.T)@P/lam

    r0_est = theta_hat[3]
    s0_est = A0*AM1 - theta_hat[0]
    s1_est = A0*AM2 - theta_hat[1]
    t0_est = A0*AM_SUM

    M = np.array([r0_est, s0_est, s1_est, t0_est], float).reshape(-1, 1)
    N = np.array([-u_val[k-1], -y_measure[k], -y_measure[k-1], uc_val[k]], float).reshape(M.shape)
    u_val = np.concatenate((u_val,
                             1/theta[2]*(N.T@M).reshape(-1,)))

(time.time_ns() - time_ns)*1e-9/len(t)*1e6
```

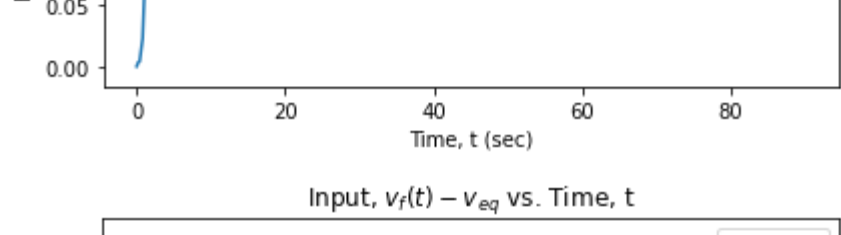
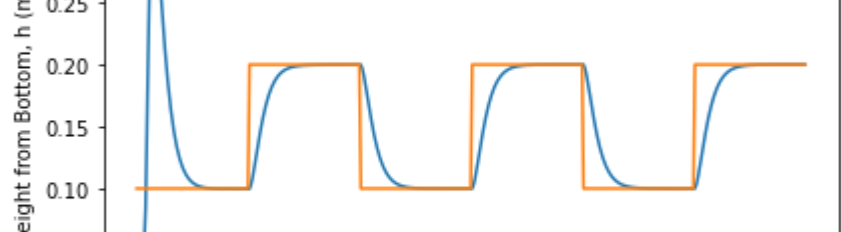
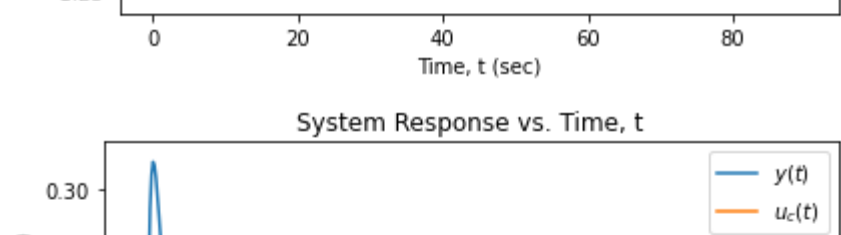
Out[17]: 67.62372505543237

```
In [18]: filepath = 'C:/Users/dboas065/University of Ottawa/ELG7113/adaptation_models/derek_model/with_pictures/'
colors = ['blue', 'orange', 'red', 'green']
for row in range(len(theta_arr)):
    plt.plot(t, theta_arr[row,:], colors=colors[row], linestyle='--')
plt.hlines(theta_hat[row][0], 0, t[len(t) - 1], colors=colors[row], linestyle='--')
plt.title('Parameter Adaptation vs. Time, t')
plt.xlabel('Time, t (sec)')
plt.ylabel('Parameter Value')
plt.legend(['$a_1$', '$a_2$', '$b_0$', '$b_1$'])
plt.tight_layout()
# plt.savefig(filepath+'adaptation.pdf', format='pdf')
plt.savefig(filepath+'adaptation_noise.pdf', format='pdf')
plt.show()

st = 0
et = len(t)

plt.plot(t[st:et], y_measure[st:et])
plt.plot(t[st:et], uc_val[st:et])
plt.title('System Response vs. Time, t')
plt.xlabel('Time, t (sec)')
plt.ylabel('Height from Bottom, h (m)')
plt.legend(['$y(t)$', '$u_c(t)$'])
plt.tight_layout()
# plt.savefig(filepath+'output.pdf', format='pdf')
plt.savefig(filepath+'output_noise.pdf', format='pdf')
plt.show()

plt.step(t[st:et], u_val[st:et])
plt.title('Input, $v_f(t) - v_{eq}$ vs. Time, t')
plt.xlabel('Time, t (sec)')
plt.ylabel('Air Speed, $v_f(t) - v_{eq}$ ($m/s^2$)')
plt.legend(['$u(t)$'])
plt.tight_layout()
# plt.savefig(filepath+'input.pdf', format='pdf')
plt.savefig(filepath+'input_noise.pdf', format='pdf')
plt.show()
```



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In [ ]:
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In [ ]:
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In [ ]:
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