

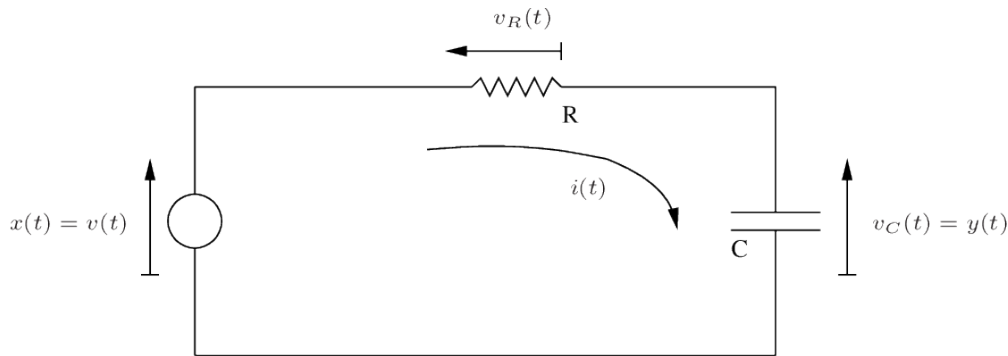
lab_freqresprclp

August 27, 2017

1 Frequency response for first-order RC lowpass filter

1.1 The problem

In a previous lab we considered numerically solving the first-order lowpass filter circuit below:



The input signal $x(t)$ is the source voltage and the output $y(t)$ is the voltage across the capacitor.

Using standard techniques the governing differential equation is found to be

$$y(t) + RC \frac{dy(t)}{dt} = x(t).$$

For known $x(t)$ we can use this equation to solve for the corresponding output $y(t)$. This is a first-order differential equation in $y(t)$, so one auxiliary condition will be required to specify $y(t)$ fully (think of homogeneous and particular solutions).

Forming the discretised signals $x[n] = x(nT)$ and $y[n] = y(nT)$ for some small $T > 0$, the standard Euler method can be used to derive the forward and reverse iterations

$$y[n+1] \approx y[n] + \frac{T}{RC}(x[n] - y[n]) \quad \text{and} \quad y[n-1] \approx y[n] - \frac{T}{RC}(x[n] - y[n]).$$

We could also derive the backward or implicit Euler method for the discretisation, where the forward and backward iterations are

$$y[n] = \frac{1}{1 + T/(RC)}y[n-1] + \frac{T/(RC)}{1 + T/(RC)}x[n] \quad \text{and} \quad y[n] = \frac{1}{1 - T/(RC)}y[n+1] - \frac{T/(RC)}{1 - T/(RC)}x[n].$$

If the value of T is too large then the Euler method becomes unstable. The implicit Euler method has better stability, but in most cases requires more computation to solve.

In this lab we want to consider the response of the system to the input $x(t) = \cos(\omega_0 t)$ for different values of ω_0 . This is called the *steady state response* for the frequency ω_0 .

However, an auxiliary condition is still required to fully specify the output. To investigate this effect we will first consider the input $x(t) = \cos(\omega_0 t)u(t)$, which is zero for negative time. In other words the signal suddenly "starts" at time $t = 0$. We will consider initial conditions of the form $y(t_0) = y_0$ for some time t_0 and given value y_0 .

1.2 Basic frequency response

The following function uses the discrete formulation above to approximately find the output signal $y[n]$ for a given input $x[n]$, subject to the initial condition $y[n_0] = y_0$. The initial condition is first used to populate one element of the output, and the recursions are then used in both directions to obtain the full solution.

```
In [13]: import numpy as np
import matplotlib.pyplot as plt
%matplotlib notebook

def rclowpass_resp(xv,n0,y0,TdRC,bflag=0):
    """RC lowpass output from given input using standard Euler
    xv: input signal (array)
    n0, y0: auxiliary condition yv[n0] = y0
    TdRC: value T/RC
    bflag: method Euler forward (0) or backward (1)
    returns yv: output signal (array)
    """

    yv = np.zeros(xv.shape);
    yv[n0] = y0;

    if bflag==0:
        # Forward Euler in each direction
        for n in range(n0,len(xv)-1):
            yv[n+1] = yv[n] + TdRC*(xv[n] - yv[n]); # forward recursion
        for n in range(n0,0,-1):
            yv[n-1] = yv[n] - TdRC*(xv[n] - yv[n]); # reverse recursion
    else:
        # Backward (implicit) Euler in each direction
        for n in range(n0,len(xv)-1):
            yv[n+1] = 1/(1+TdRC)*yv[n] + TdRC/(1+TdRC)*xv[n+1]; # forward recursion
        for n in range(n0,0,-1):
            yv[n-1] = 1/(1-TdRC)*yv[n] - TdRC/(1-TdRC)*xv[n-1]; # reverse recursion
```

```
return yv;
```

We generate an input xv containing the values of $x(t) = \cos(\omega_0 t)u(t)$ for a fixed frequency $\omega_0 = 1$ and a range of values tv :

```
In [14]: # Input signal and discretisation
omega0 = 1; # current frequency
T = 0.01; # small number
if omega0==0: T0 = np.inf;
else: T0 = 2*np.pi/omega0; # waveform period (seconds) for current omega0
nv = np.arange(-200,2000); # discrete signal indices n
tv = nv*T; # time values corresponding to indices t=nT
xv = np.zeros(tv.shape);
for i in range(0,len(xv)): xv[i] = np.cos(omega0*tv[i])*(tv[i]>=0);
```

Suppose the initial condition on the output is $y(0) = 0.2$. We can find the corresponding output, and plot both the input and the output on the same set of axes:

```
In [15]: # Response for given initial condition
RC = 1; TdRC = T/RC;
n0 = np.where(nv==0)[0][0]; # find location in nv with zero value
y0 = 0.2;
yv = rclowpass_resp(xv,n0,y0,TdRC,0);
fig = plt.figure(); ph = plt.plot(tv,xv,'r-',tv,yv,'g-');
plt.xlabel('t'); plt.legend(['Input x(t)', 'Output y(t)']); plt.ylim((-1.5,1.5));
```

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Some interesting observations can be made:

- Prior to time $t = 0$ we see the output approaching the value 0.2 from above. We can understand this in terms of the original circuit. Remember that for negative values of time the input voltage $x(t)$ is zero, so the voltage source on the left is a short circuit. The capacitor is therefore simply discharging through the resistor. Since the auxiliary condition says that at time $t = 0$ the capacitor voltage must be 0.2 volts, for negative time this voltage must have been positive and much bigger.
- The initial onset of the signal occurs at $t = 0$. After some time has passed we see a simple relationship between the output and the input: both are sinusoids at the same frequency, but

the output is delayed relative to the input and its amplitude has been reduced. We call this the steady-state response. Essentially, for large t the input is $x(t) = \cos(\omega_0 t)$ and the output can be written as $y(t) = A \cos(\omega_0 t + \theta)$ for some A and θ .

- Just after $t = 0$, but before the system has reached steady state, the output has a period of disturbance. This transient depends on the initial conditions, but (since the system is stable) will die down after enough time has passed. The steady-state response is independent of the initial conditions.

For the case shown above we can characterise the steady-state response for the driving frequency ω_0 by estimating A and θ for large t . The following block of code calculates these estimates by searching backwards to find the position and value of the last positive peak in each signal.

```
In [16]: # Use local maxima for input and output signals to estimate gain and phase
from scipy.signal import argrelmax

xvلمي = argrelmax(xv)[0]; # locations of local maxima
yvلمي = argrelmax(yv)[0];
if len(xvلمي)<2 or len(yvلمي)<2: raise RuntimeError # not enough peaks found
xlلمي = xvلمي[-1]; ylلمي = yvلمي[-1]; # locations of last maximum

# Required quantities
gain = yv[ylلمي]/xv[xللمي]; # ratio of peak amplitudes
tdelay = tv[xللمي] - tv[ylلمي]; # time delay (seconds) output peak relative to input
theta = 2*np.pi*tdelay/T0; # delay in units of radians
while theta<=np.pi: theta = theta + 2*np.pi; # add or subtract multiples of 2*pi un
while theta>np.pi: theta = theta - 2*np.pi;

print('Last output peak: y(', tv[ylلمي], ') =', yv[ylلمي]);
print('Preceeding input peak: x(', tv[xللمي], ') =', xv[xللمي]);
print('Gain: A =', gain);
print('Phase lag: theta =', theta, 'radians');
```

```
Last output peak: y( 19.64 ) = 0.708880372464
Preceeding input peak: x( 18.85 ) = 0.999999901397
Gain: A = 0.708880442362
Phase lag: theta = -0.79 radians
```

Some discussion of how the phase is represented is useful. Shifting a signal by a phase of 2π radians corresponds to a time shift of one cycle or one wavelength T_0 , where $T_0 = 2\pi/\omega_0$. Thus, for example, a phase shift of π corresponds to a time shift of half a wavelength, and $\pi/2$ to a shift of a quarter wavelength.

1.3 Investigation

The code in the previous section is combined into a single script below.

```
In [17]: %run src/labX_preamble.py # For internal notebook functions
```

```
In [18]: %%writefileexec src/lab_freqresprclp-1.py -s # dump cell to file before execute
```

```
import numpy as np
import matplotlib.pyplot as plt
from scipy.signal import argrelmax
%matplotlib notebook

def rclowpass_resp(xv,n0,y0,TdRC,bflag=0):
    """RC lowpass output from given input using standard Euler
    xv: input signal (array)
    n0, y0: auxiliary condition yv[n0] = y0
    TdRC: value T/RC
    bflag: method Euler forward (0) or backward (1)
    returns yv: output signal (array)
    """

    yv = np.zeros(xv.shape);
    yv[n0] = y0;

    if bflag==0:
        # Forward Euler in each direction
        for n in range(n0,len(xv)-1):
            yv[n+1] = yv[n] + TdRC*(xv[n] - yv[n]); # forward recursion
        for n in range(n0,0,-1):
            yv[n-1] = yv[n] - TdRC*(xv[n] - yv[n]); # reverse recursion
    else:
        # Backward (implicit) Euler in each direction
        for n in range(n0,len(xv)-1):
            yv[n+1] = 1/(1+TdRC)*yv[n] + TdRC/(1+TdRC)*xv[n+1]; # forward recursion
        for n in range(n0,0,-1):
            yv[n-1] = 1/(1-TdRC)*yv[n] - TdRC/(1-TdRC)*xv[n-1]; # reverse recursion

    return yv;

# Input signal and discretisation
N = 20000;
omega0 = 0.1; # current frequency
T = 0.01; # small number
#T = 10/N*RC;
print('T=',T)
print('T0=', T0)
```

```

print('T0/180=', T0/180)

if omega0==0: T0 = np.inf;
else: T0 = 2*np.pi/omega0; # waveform period (seconds) for current omega0
#nv = np.arange(-200,2000); # discrete signal indices n
nv = np.arange(-200,N); # discrete signal indices n
tv = nv*T; # time values corresponding to indices t=nT
xv = np.zeros(tv.shape);
for i in range(0,len(xv)): xv[i] = np.cos(omega0*tv[i])*(tv[i]>=0);

# Response for given initial condition
RC = 1; TdRC = T/RC;
n0 = np.where(nv==0)[0][0]; # find location in nv with zero value
y0 = 0.2;
yv = rclowpass_resp(xv,n0,y0,TdRC,0);
fig = plt.figure(); ph = plt.plot(tv,xv,'r-',tv,yv,'g-');
plt.xlabel('t'); plt.legend(['Input x(t)','Output y(t)']); plt.ylim((-1.5,1.5));

# Use local maxima for input and output signals to estimate gain and phase
xvlmi = argrelmax(xv)[0]; # locations of local maxima
yvlmi = argrelmax(yv)[0];
if len(xvlmi)<2 or len(yvlmi)<2: raise RuntimeError # not enough peaks found
xlmi = xvlmi[-1]; ylmi = yvlmi[-1]; # locations of last maximum

# Required quantities
gain = yv[ylmi]/xv[xlmi]; # ratio of peak amplitudes
tdelay = tv[xlmi] - tv[ylmi]; # time delay (seconds) output peak relative to input
theta = 2*np.pi*tdelay/T0; # delay in units of radians
while theta<=np.pi: theta = theta + 2*np.pi; # add or subtract multiples of 2*pi un
while theta>np.pi: theta = theta - 2*np.pi;

print('Last output peak: y(', tv[ylmi], ') =', yv[ylmi]);
print('Last input peak: x(', tv[xlmi], ') =', xv[xlmi]);
print('Gain: A =', gain);
print('Phase lag: theta =', theta, 'radians');

```

```

T= 0.01
T0= 6.283185307179586
T0/180= 0.03490658503988659

```

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Last output peak: $y(189.49) = 0.995086427334$
 Last input peak: $x(188.5) = 0.999999901397$
 Gain: $A = 0.995086525452$
 Phase lag: $\theta = -0.099$ radians

The following items involve investigations that you should perform to investigate the nature of the problem being addressed:

- Run the code above for the case of $\omega = 0$, where the input simply becomes the step function at the origin. The method used for phase estimation will fail because there are no peaks, but the input-output plot is still correct. By changing the value of RC confirm that after about $5RC$ seconds have passed the transient has decayed almost entirely away, and the system reaches its steady state (in this case DC) response. Convince yourself that this is true regardless of the initial value y_0 . The quantity $\tau = RC$ is called the *time constant* of the circuit, and it determines the time duration of transients in the system.
- Consider changing the frequency ω_0 of the input. Try for example $\omega_0 = 1, 2, 5, 10$ radians per second. Make a note of the gain A and phase lag θ for each case. You should observe that the gain *decreases* as ω_0 increases. In other words the circuit attenuates high frequencies more than low frequencies, and is hence a lowpass filter. Confirm that the steady-state gain and phase lags are independent of the initial conditions.
- Observe that the code as written doesn't work for $\omega_0 = 0.1$, because the interval over which we've calculated signal values is too short for the peak search method to work. Modify `nv` to calculate the signal over a longer time period using say `nv = np.arange(-200, 100000)`: the method then works for $\omega_0 = 0.1$ but now fails for $\omega = 0.005$. It also requires more computation.
- Instead of increasing the length of `nv`, another way of increasing the length of time over which the output is calculated is to increase T . However, the discrete approximation is only valid for small T , and for the given system given it can be shown that stability of the numerical method requires that $T < 2RC$. Run the code with $\omega = 0.005$ for $T = 1$ and $T = 2.1$, and observe that in the latter case the standard Euler method fails. Check that for this case the implicit Euler method does however still work.

1.4 Frequency representation and Bode plot

In this course we will see (or might already have seen) that the RC circuit has a transfer function

$$H(\omega) = \frac{1/RC}{1/RC + j\omega}.$$

This system has a real impulse response so $H(-\omega) = H^*(\omega)$. The exact analytical form for the steady-state response to the input signal $x(t) = \cos(\omega t)$ is quite easily shown to be

$$y(t) = |H(\omega)| \cos(\omega t + \angle H(\omega)).$$

A plot of this magnitude and phase response calculated over a range of frequencies follows. Also shown on the plot is a single point showing the gain and phase obtained from the time-domain response for the last calculated frequency.

```
In [19]: # One-sided Bode plot values log-log
lwv = np.linspace(-3, 5, 1000); # linear points in log space
wv = 10**lwv; # actual frequencies
Hv = (1/RC)/((1/RC)+1j*wv); # frequency response
dbHv = 10*np.log10(np.abs(Hv)**2); # magnitude response in dB

# Current point
lw0 = np.log10(omega0);
dbHvw0 = 10*np.log10(np.abs(gain)**2);

# Plot
fh, ax = plt.subplots(2);
ax[0].plot(lwv, dbHv, c='g'); ax[0].set_ylabel('$10 \log_{10} |H(\omega)|^2$');
ax[0].scatter(lw0, dbHvw0);
ax[1].plot(lwv, np.angle(Hv), c='g'); ax[1].set_ylabel(r'$\angle H(\omega)$');
ax[1].scatter(lw0, theta);
plt.xlabel('$\log_{10} \omega$');
```

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1.5 Code

The code snippets above are combined into the script below, with some rearrangement.

```
In [20]: %%writefileexec src/lab_freqresprclp-2.py -s # dump cell to file before execute

import numpy as np
import matplotlib.pyplot as plt
%matplotlib notebook

def rclowpass_resp(xv,n0,y0,TdRC,bflag=0):
    """RC lowpass output from given input using standard Euler
    xv: input signal (array)
    n0, y0: auxiliary condition yv[n0] = y0
    TdRC: value T/RC
    bflag: method Euler forward (0) or backward (1)
    returns yv: output signal (array)
```



```

"""

yv = np.zeros(xv.shape);
yv[n0] = y0;

if bflag==0:
    # Forward Euler in each direction
    for n in range(n0,len(xv)-1):
        yv[n+1] = yv[n] + TdRC*(xv[n] - yv[n]); # forward recursion
    for n in range(n0,0,-1):
        yv[n-1] = yv[n] - TdRC*(xv[n] - yv[n]); # reverse recursion
else:
    # Backward (implicit) Euler in each direction
    for n in range(n0,len(xv)-1):
        yv[n+1] = 1/(1+TdRC)*yv[n] + TdRC/(1+TdRC)*xv[n+1]; # forward recursion
    for n in range(n0,0,-1):
        yv[n-1] = 1/(1-TdRC)*yv[n] - TdRC/(1-TdRC)*xv[n-1]; # reverse recursion

return yv;

# Input signal and discretisation
omega0 = 1; # current frequency
T = 0.01; # small number
#T = 0.001*(2*np.pi/omega0); # small number relative to wavelength
nv = np.arange(-200,2000); # discrete signal indices n
tv = nv*T; # time values corresponding to indices t=nT
xv = np.zeros(tv.shape);
for i in range(0,len(xv)): xv[i] = np.cos(omega0*tv[i])*(tv[i]>=0);

# Response for given initial condition
RC = 1; TdRC = T/RC;
n0 = np.where(nv==0)[0][0]; # find location in nv with zero value
y0 = 0.2;
yv = rclowpass_resp(xv,n0,y0,TdRC,0);
fig = plt.figure(); ph = plt.plot(tv,xv,'r-',tv,yv,'g-');
plt.xlabel('t'); plt.legend(['Input x(t)','Output y(t)']); plt.ylim((-1.5,1.5));
#raise

# Search signals from back finding positive peaks (this works for the cases of interest)
no = len(yv)-1;
while no-1>=0 and yv[no-1]<yv[no]: no = no - 1; # chomp decreasing from back
while no-1>=0 and yv[no-1]>yv[no]: no = no - 1; # stop when not increasing from back
ni = no; # "no" should be first positive peak from end
while ni-1>=0 and xv[ni-1]<xv[ni]: ni = ni - 1; # chomp decreasing from back
while ni-1>=0 and xv[ni-1]>xv[ni]: ni = ni - 1; # stop when not increasing from back

# Period of input and output waveforms
if omega0==0: T0 = np.inf;

```

```

else: T0 = 2*np.pi/omega0; # waveform period (seconds) for current omega_0

# Required quantities
gain = yv[no]/xv[ni]; # ratio of peak amplitudes
tdelay = tv[ni] - tv[no]; # time delay (seconds) output peak relative to input
theta = 2*np.pi*tdelay/T0; # delay in units of radians

print('Last output peak: y(', tv[no], ') =', yv[no]);
print('Preceeding input peak: x(', tv[ni], ') =', xv[ni]);
print('Gain: A =', gain);
print('Phase lag: theta =', theta, 'radians');

# One-sided Bode plot values log-log
lwv = np.linspace(-3, 5, 1000); # linear points in log space
wv = 10**lwv; # actual frequencies
Hv = (1/RC)/((1/RC)+1j*wv); # frequency response
dbHv = 10*np.log10(np.abs(Hv)**2); # magnitude response in dB

# Current point
lw0 = np.log10(omega0);
dbHvw0 = 10*np.log10(np.abs(gain)**2);

# Plot
fh, ax = plt.subplots(2);
ax[0].plot(lwv, dbHv, c='g'); ax[0].set_ylabel('$10 \log_{10} |H(\omega)|^2$');
ax[0].scatter(lw0, dbHvw0);
ax[1].plot(lwv, np.angle(Hv), c='g'); ax[1].set_ylabel(r'$\angle H(\omega)$');
ax[1].scatter(lw0, theta);
plt.xlabel('$\log_{10} \omega$');

```

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```

Last output peak: y( 19.64 ) = 0.708880372464
Preceeding input peak: x( 18.85 ) = 0.999999901397
Gain: A = 0.708880442362
Phase lag: theta = -0.79 radians

```

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Out[20]: <matplotlib.text.Text at 0x11fb10080>

2 Tasks

These tasks involve writing code, or modifying existing code, to meet the objectives described.

1. Use the `rclowpass_resp` function definition and the subsequent snippets of code to "experimentally" calculate and plot the frequency response magnitude and phase of the RC circuit differential equation over the range $\log_{10} \omega = -4$ to $\log_{10} \omega = 4$. Use $RC = 1$. Also include the theoretical response curves in your plot.
2. Build an actual circuit, and use a signal generator and scope to verify and compare.

In []: