Neuromorphic engineering I

# **Lab 8: Silicon Synaptic Circuits**

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Date: 21.11.22

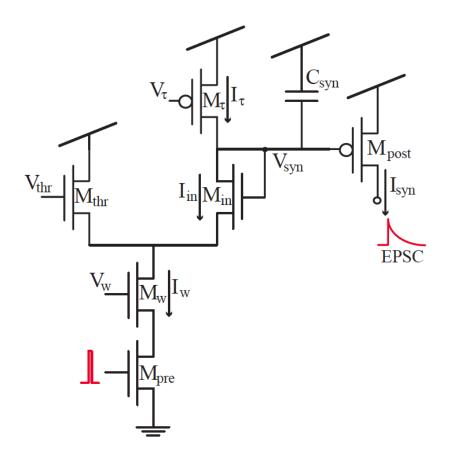
This week, we will see how synaptic circuits generate currents when stimulated by voltage pulses. Specifically we will measure the response of the synapse to a single pulse, and to a sequence of spikes.

The objectives of this lab are to:

- Analyze log-domain synapse circuits.
- Measure the response properties of the diff-pair integrator (DPI) synapse and of the dual diff-pair integrator (DDI) synapse.

### 1. Prelab

A Differential Pair Integrator circuit



(1) Write the equations characterizing  $I_w, I_{thr}, I_{in}, I_{\tau}, I_{syn}, I_C$  assuming all corresponding FETs are in saturation and operate in weak-inversion.

$$I_{w} = I_{0}e^{rac{\kappa V_{W}}{U_{T}}} \ I_{thr} = I_{0}e^{rac{\kappa V_{Thr} - V_{dd00}}{U_{T}}} \ I_{in} = I_{W}rac{e^{f}rac\kappa V_{syn}U_{T}}{e^{rac{\kappa V_{syn}}{U_{T}}} + e^{rac{\kappa V_{Thr}}{U_{T}}}} \ I_{ au} = I_{0}e^{rac{\kappa (V_{dd} - V_{ au})}{U_{T}}} \ I_{syn} = I_{0}e^{rac{\kappa (V_{dd} - V_{syn})}{U_{T}}} \ I_{C} = Crac{d}{dt}(V_{dd} - V_{syn})$$

(2) What is the time constant of the circuit?

$$au = rac{C_{syn}U_T}{\kappa I_ au}$$

(3) Derive the circuit's response to a step input assuming  $I_w(t<0)=0, I_w(t>0)\gg I_ au.$ 

The non-linear ODE for this circuit is:

$$au(1+rac{I_{th}}{I_{syn}})rac{d}{dt}I_{syn}+I_{syn}=rac{I_{th}I_{in}}{I_{ au}}-I_{th}$$

If  $I_{syn}$  increases enough (such as  $I_{syn}>I_{Th}$ ) and  $I_W>>I_{ au}$  we get the following diff equation:

$$au rac{d}{dt} I_{syn} + I_{syn} = rac{I_{th} I_{in}}{I_{ au}} = rac{I_w I_{gain}}{I_{ au}}$$

and so:

$$rac{d}{dt}I_{syn} = rac{I_wI_{gain}}{I_{ au au}} - rac{I_{syn}}{ au}$$

By solving (Laplace-Heaviside), taking  $I_w = X = \text{input}$ , and  $Y = I_{syn}$  we get:

$$H(s) = rac{Y}{X} = rac{I_g}{I_ au(1+ au s)}$$

We can then find the poles:

$$s = -\frac{1}{\tau}$$

We can then replace in the general form of the solution:

$$y(t)=Ye^{-}rac{t}{ au}$$

Then use the H(s) equation to solve for Y:

$$Y = rac{I_g X}{I_ au (1 + au s)}$$

We can then replace the terms into the differential equation and add the particular solution (or initial condition), and we get:

$$I_{syn}(t) = rac{I_{gain}I_w}{I_ au} igg(1-e^{-rac{\left(t-t_i^-
ight)}{ au}}igg) + I_{syn}^-e^{-rac{\left(t-t_i^-
ight)}{ au}}$$

where,  $t_i^+ - t_i^-$  is the duration of the input spike and  $I_{syn}^-$  is the initial current at t=0

**(4)** Derive the circuit's response to a step input assuming  $I_w(t<0)\gg I_{ au},I_w(t>0)=0.$ 

We proceed the same way as previously and we get:

$$I_{syn}(t) = \left\{ egin{align*} I_{syn}e^{-rac{\left(t-t_i^+
ight)}{ au}} \end{array} 
ight.$$

**(5)** Suppose we stimulate the circuit with a regular spike train of frequency f (high enough). What happens to  $I_{syn}$  in steady-state (average value)?

At steady state, we have:

$$rac{d}{dt}I_{syn} = rac{I_wI_{gain}}{I_ au} - I_{syn} = 0$$

So

$$|< I_{syn}> = rac{I_w I_{gain}}{I_{ au}} f \Delta t$$

Where  $\Delta t$  is the pulse duration.  $I_{Sun}$  is linearly dependant on the spike frequency

(6) In what conditions (tau and thr) is the step response dependent only on  $I_w$ ?

If  $I_{gain/thr}=I_{ au}$  and then  $I_{syn}$  is entirely dependent on  $I_w$ . We can also view this by plotting the charge equation (the first diff. equation). The equation plateaus at  $I_w$ . In the other case it would plateau at  $\frac{I_wI_{gain}}{I_{ au}}$ 

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

def plot_charge(dt=20,Iw = 1, Ig = 1, It = 1, tau = 3):
    t = np.arange(0,dt)
    Isynt = [((Ig*Iw)/It)*(1-np.exp(-(i/tau))) for i in t]
    return Isynt, t

I1, t1 = plot_charge()
I2, t2 = plot_charge(Iw = 2)
    plt.plot(t1,I1,label=r"$I_w = 1$")
    plt.plot(t2,I2,label=r"$I_w = 2$")
    plt.legend()
    plt.title(r"Comparison of $I_{syn}(t)=\frac{I_{gain}}{I_{w}}{I_{w}}{I_{w}}{I_{w}}<0.5cm</pre>
```

# 2 Setup

### 2.1 Connect the device

```
In []: # import the necessary libraries
   import pyplane
   import time
   import numpy as np
   import matplotlib.pyplot as plt
   from scipy import interpolate
```

```
In [ ]: # create a Plane object and open the communication
        if 'p' not in locals():
            p = pyplane.Plane()
            try:
                p.open('/dev/ttyACM0')
            except RuntimeError as e:
                del p
                print(e)
In [ ]: p.get_firmware_version()
In [ ]: # Send a reset signal to the board, check if the LED blinks
        p.reset(pyplane.ResetType.Soft)
        time.sleep(0.5)
        # NOTE: You must send this request events every time you do a reset operation, other
        # Because the class chip need to do handshake to get the communication correct.
        p.request_events(1)
In [ ]: # Try to read something, make sure the chip responses
        p.read_current(pyplane.AdcChannel.GO0_N)
In [ ]: # If any of the above steps fail, delete the object, close and halt, stop the serv
        # please also say your board number: ttyACMx
        # del p
```

## 2.2 Chip configuration

• To measure DPI synapse:

### 2.3 C2F

• To set up the C2F circuit:

```
pyplane.Coach.BiasGenMasterCurrent.I240nA, 255)])
p.send coach events([pyplane.Coach.generate biasgen event()
   pyplane.Coach.BiasAddress.C2F_PWLK_P, \
   pyplane.Coach.BiasType.P, \
   pyplane.Coach.BiasGenMasterCurrent.I240nA, 255)])
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
   pyplane.Coach.BiasAddress.C2F REF L, \
   pyplane.Coach.BiasType.N, \
   pyplane.Coach.BiasGenMasterCurrent.I240nA, 255)])
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
   pyplane.Coach.BiasAddress.C2F_REF_H, \
   pyplane.Coach.BiasType.P, \
   pyplane.Coach.BiasGenMasterCurrent.I240nA, 255)])
# setup output rail-to-rail buffer
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
   pyplane.Coach.BiasAddress.RR_BIAS_P, \
   pyplane.Coach.BiasType.P, \
   pyplane.Coach.BiasGenMasterCurrent.I240nA, 255)])
```

## 2.4 BiasGen

In a simplified form, the output of a branch of the BiasGen will be the gate voltage  $V_b$  for the bias current  $I_b$ , and if the current mirror has a ratio of w and the bias transistor operates in subthreshold-saturation:

$$I_b = w \frac{BG_{fine}}{256} I_{BG_{master}} \tag{1}$$

Where  $I_{BG_{master}}$  is the <code>BiasGenMasterCurrent</code>  $\in \{60~{
m pA}, 460~{
m pA}, 3.8~{
m nA}, 30~{
m nA}, 240~{
m nA}\}$ ,  $BG_{fine}$  is the integer fine value  $\in [0, 256)$ 

To set a bias, use the function similar to the following:

```
p.send_coach_event(pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.BIAS_NAME, \
    pyplane.Coach.BiasType.BIAS_TYPE, \
    pyplane.Coach.BiasGenMasterCurrent.MASTER_CURRENT, FINE_VALUE))
```

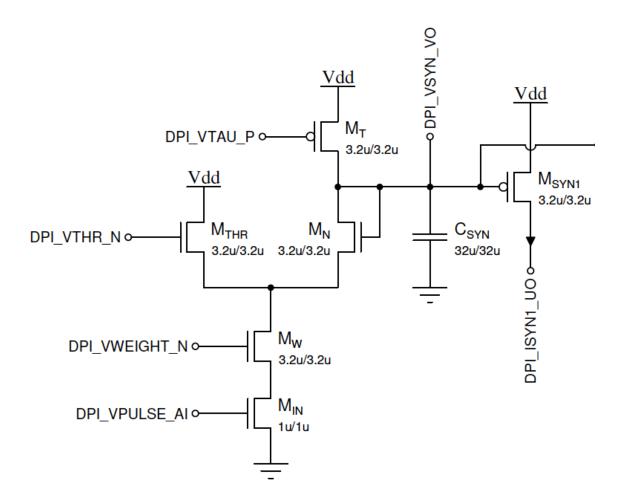
You may have noticed that there are some biases that are not used to directly generate a current, but rather what matters is the voltage, e.g.  $V_{gain}$ ,  $V_{ex}$  and  $V_{inh}$  in our HWTA circuit. Even though they may have a <code>BIAS\_NAME</code> ending with <code>\_N</code> or <code>\_P</code> it only indicates that they are connected to the gate of an N- or a P-FET, but the <code>BIAS\_TYPE</code> parameter can be both <code>\_N</code> or <code>\_P</code> . For example, setting a <code>\_N</code> bias to <code>BIAS\_TYPE</code> = P will only make this voltage very close to GND, which <code>is</code> sometimes the designed use case.

### 2.5 Pulse extender circuit

In case you didn't look into the last problem in prelab, the pulse extender circuit basically defines the pulse width, which is inversely proportional to the parameter PEX\_VTAU\_N .

# 3 DPI synapse

The **DPI synapse** receives a voltage pulse train,  $V_{pulse}$ , as input and outputs a corresponding synaptic current,  $I_{syn}$ . Additionally, the synaptic voltage,  $V_{syn}$ , is provided. Bias parameters  $V_{weight} \ \& \ V_{tau}$  affect the amplitude and decay of the response, while  $V_{thr}$  acts as an additional weight bias.  $C_{syn}$  sizing was chosen for a capacitance of 2pF.



#### Pin map

```
V_{syn} = adc[14] I_{sun} = c2f[9]
```

The task of this exercise it to tune the parameters and observe the behavior of the DPI synapse.

# 3.1 Basic impulse response

#### Set parameters

```
In [ ]: p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 25)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTHR_N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI VWEIGHT N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
```

#### Data acquisition

```
In []: N_pulses = 2 # for each trial, send 2 input pulses
    N_samples_per_pulse = 10 # for each input pulse, sample 10 points
    N_samples = N_pulses*N_samples_per_pulse
    dT = 0.02 # delta t between the samples, DO NOT CHANGE
    t = np.arange(N_samples)*dT
    vsyn = np.zeros(N_samples)
    isyn = np.zeros(N_samples)
    isyn = np.zeros(N_samples)
    for k in range(N_pulses):
        p.send_coach_events([pyplane.Coach.generate_pulse_event()])
        for i in range(N_samples_per_pulse):
            vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
            inter=p.read_c2f_output(dT)
            isyn[k*N_samples_per_pulse+i] += inter[9]
```

```
In [ ]:
```

#### Plot the data

```
In [ ]: import matplotlib.pyplot as plt
        import numpy as np
        plt.rcParams.update({'font.size': 15})
        t,vsyn,isyn = np.loadtxt('data_ex_3_1.csv',delimiter=',')
        plt.plot(t,vsyn,'-')
        plt.xlabel('t [s]')
        plt.ylabel('$V_{syn}$ [V]')
        plt.legend(['$V_{syn}$'],bbox_to_anchor=(1.05, 1),loc='upper left')
        plt.title('Fig. 1: Measured values of $V_{syn}$ as a function of time')
        plt.grid()
        plt.show()
        plt.plot(t,isyn,'-')
        plt.xlabel('t [s]')
        plt.ylabel('C2F [Hz]')
        plt.legend(['C2F$(I_{syn})$'],bbox_to_anchor=(1.05, 1),loc='upper left')
        plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')
        plt.grid()
        plt.show()
```

#### Save the data

```
In [ ]: np.savetxt('data_ex_3_1.csv',[t,vsyn,isyn] , delimiter=',')
```

# 3.2 Different $I_{weight}$

Repeat 3.1 with a smaller and a larger  $I_{weight}$ , compare the three curves in the same plot.

#### Set smaller bias

```
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.DPI_VWEIGHT_N, \
    pyplane.Coach.BiasType.N, \
    pyplane.Coach.BiasGenMasterCurrent.I30nA, 50)]) #change weight

p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.PEX_VTAU_N, \
    pyplane.Coach.BiasType.N, \
    pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
```

#### Data acquisition

```
In [ ]: N_pulses = 2 # for each trial, send 2 input pulses
    N_samples_per_pulse = 10 # for each input pulse, sample 10 points
    N_samples = N_pulses*N_samples_per_pulse
    dT = 0.02 # delta t between the samples, DO NOT CHANGE
    t = np.arange(N_samples)*dT
    vsyn = np.zeros(N_samples)
    isyn = np.zeros(N_samples)
    for k in range(N_pulses):
        p.send_coach_events([pyplane.Coach.generate_pulse_event()])
        for i in range(N_samples_per_pulse):
            vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
            inter=p.read_c2f_output(dT)
            isyn[k*N_samples_per_pulse+i] += inter[9]
```

#### Save data

```
In [ ]: np.savetxt('data_ex_3_2_smaller.csv',[t,vsyn,isyn] , delimiter=',')
```

#### Set largerer bias

```
pyplane.Coach.BiasType.N, \
pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
```

#### Data acquisition

```
In []: N_pulses = 2 # for each trial, send 2 input pulses
    N_samples_per_pulse = 10 # for each input pulse, sample 10 points
    N_samples = N_pulses*N_samples_per_pulse
    dT = 0.02 # delta t between the samples, DO NOT CHANGE
    t = np.arange(N_samples)*dT
    vsyn = np.zeros(N_samples)
    isyn = np.zeros(N_samples)
    for k in range(N_pulses):
        p.send_coach_events([pyplane.Coach.generate_pulse_event()])
        for i in range(N_samples_per_pulse):
            vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
            inter=p.read_c2f_output(dT)
            isyn[k*N_samples_per_pulse+i] += inter[9]
```

#### Save data

```
In [ ]: np.savetxt('data_ex_3_2_bigger.csv',[t,vsyn,isyn] , delimiter=',')
```

#### Plot

```
In [ ]: import matplotlib.pyplot as plt
        import numpy as np
        plt.rcParams.update({'font.size': 15})
        t,vsyn smaller,isyn smaller = np.loadtxt('data ex 3 2 smaller.csv',delimiter=',')
        _,vsyn_normal,isyn_normal = np.loadtxt('data_ex_3_1.csv',delimiter=',')
        _,vsyn_bigger,isyn_bigger = np.loadtxt('data_ex_3_2_bigger.csv',delimiter=',')
        plt.plot(t,vsyn_smaller,t,vsyn_normal,t,vsyn_bigger)
        plt.xlabel('t [s]')
        plt.ylabel('$V_{syn}$ [V]')
        plt.legend(['$V_{syn}$ - Smaller $I_w$','$V_{syn}$ - Normal $I_w$','$V_{syn}$ - Lar
        plt.title('Fig. 3: Measured values of $V_{syn}$ as function of time for varying $I_
        plt.grid()
        plt.show()
        plt.plot(t[1:],isyn_smaller[1:],t,isyn_normal,t,isyn_bigger)
        plt.xlabel('t [s]')
        plt.ylabel('C2F [Hz]')
        plt.legend(['C2F$(I_{syn})$ - Smaller $I_w$','C2F$(I_{syn})$ - Normal $I_w$','C2F$(
        plt.title('Fig. 4: Measured values of $I_{syn}$ as function of time for varying $I_
```

```
plt.grid()
plt.show()
```

## 3.3 Different $I_{tau}$

Repeat 3.1 with a smaller and a larger  $I_{tau}$ , compare the three curves in the same plot.

```
In [ ]: ## REMINDER , RESET ALL PARAMETERS AS 3.1
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 5)]) #change tau
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTHR_N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VWEIGHT_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
In [ ]: N_pulses = 2 # for each trial, send 2 input pulses
        N_samples_per_pulse = 10 # for each input pulse, sample 10 points
        N_samples = N_pulses*N_samples_per_pulse
        dT = 0.02 # delta t between the samples, DO NOT CHANGE
        t = np.arange(N_samples)*dT
        vsyn = np.zeros(N_samples)
        isyn = np.zeros(N_samples)
        for k in range(N_pulses):
            p.send_coach_events([pyplane.Coach.generate_pulse_event()])
            for i in range(N_samples_per_pulse):
                vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
                inter=p.read_c2f_output(dT)
                isyn[k*N_samples_per_pulse+i] += inter[9]
In [ ]: |np.savetxt('data_ex_3_3_smaller.csv',[t,vsyn,isyn] , delimiter=',')
In [ ]: p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 50)])
                                                                #change tau
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTHR_N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
```

```
In [ ]: np.savetxt('data_ex_3_3_bigger.csv',[t,vsyn,isyn] , delimiter=',')
```

vsyn[k\*N\_samples\_per\_pulse+i] += p.read\_voltage(pyplane.AdcChannel.AOUT14)

p.send\_coach\_events([pyplane.Coach.generate\_pulse\_event()])

isyn[k\*N\_samples\_per\_pulse+i] += inter[9]

isyn = np.zeros(N\_samples)
for k in range(N\_pulses):

for i in range(N\_samples\_per\_pulse):

inter=p.read c2f output(dT)

```
In [ ]: import matplotlib.pyplot as plt
         import numpy as np
         plt.rcParams.update({'font.size': 15})
         t,vsyn_smaller,isyn_smaller = np.loadtxt('data_ex_3_3_smaller.csv',delimiter=',')
         _,vsyn_normal,isyn_normal = np.loadtxt('data_ex_3_1.csv',delimiter=',')
         _,vsyn_bigger,isyn_bigger = np.loadtxt('data_ex_3_3_bigger.csv',delimiter=',')
         plt.plot(t,vsyn_smaller,t,vsyn_normal,t,vsyn_bigger)
         plt.xlabel('t [s]')
         plt.ylabel('$V_{syn}$ [V]')
         plt.legend(['$V_{syn}$ - Smaller <math>I_{\tau}$', '$V_{syn}$ - Normal <math>I_{\tau}$', '$V_{syn}$ -
         plt.title('Fig. 5: Measured values of $V_{syn}$ as function of time for varying $I_
         plt.grid()
         plt.show()
         plt.plot(t,isyn_smaller,t,isyn_normal,t,isyn_bigger)
         plt.xlabel('t [s]')
         plt.ylabel('C2F [Hz]')
         plt.legend(['C2F\$(I_{syn}))\$ - Smaller \$I_{\tau}\$', 'C2F\$(I_{syn}))\$ - Normal \$I_{\tau}\$', 'C2F\$(I_{syn})
         plt.title('Fig. 6: Measured values of $I_{syn}$ as function of time for varying $I_
         plt.grid()
         plt.show()
```

## 3.4 Different $I_{thr}$

Repeat 3.1 with a smaller and a larger  $I_{thr}$ , compare the three curves in the same plot.

```
In [ ]: p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 25)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTHR_N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)]) #change threshold
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI VWEIGHT N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
```

```
In [ ]: N pulses = 2 # for each trial, send 2 input pulses
        N_samples_per_pulse = 10 # for each input pulse, sample 10 points
        N_samples = N_pulses*N_samples_per_pulse
        dT = 0.02 # delta t between the samples, DO NOT CHANGE
        t = np.arange(N samples)*dT
        vsyn = np.zeros(N_samples)
        isyn = np.zeros(N_samples)
        for k in range(N pulses):
            p.send_coach_events([pyplane.Coach.generate_pulse_event()])
            for i in range(N_samples_per_pulse):
                vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
                inter=p.read_c2f_output(dT)
                isyn[k*N_samples_per_pulse+i] += inter[9]
In [ ]: np.savetxt('data_ex_3_4_smaller.csv',[t,vsyn,isyn] , delimiter=',')
In [ ]: p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 25)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTHR_N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 80)]) #change threshold
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI VWEIGHT N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
        p.send coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
In [ ]: N_pulses = 2 # for each trial, send 2 input pulses
        N_samples_per_pulse = 10 # for each input pulse, sample 10 points
        N samples = N pulses*N samples per pulse
        dT = 0.02 # delta t between the samples, DO NOT CHANGE
        t = np.arange(N_samples)*dT
        vsyn = np.zeros(N samples)
        isyn = np.zeros(N_samples)
        for k in range(N_pulses):
            p.send coach events([pyplane.Coach.generate pulse event()])
            for i in range(N_samples_per_pulse):
                vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
                inter=p.read c2f output(dT)
                isyn[k*N_samples_per_pulse+i] += inter[9]
In [ ]: np.savetxt('data_ex_3_4_bigger.csv',[t,vsyn,isyn] , delimiter=',')
In [ ]: import matplotlib.pyplot as plt
        import numpy as np
```

```
plt.rcParams.update({'font.size': 15})
t,vsyn_smaller,isyn_smaller = np.loadtxt('data_ex_3_4_smaller.csv',delimiter=',')
_,vsyn_normal,isyn_normal = np.loadtxt('data_ex_3_1.csv',delimiter=',')
_,vsyn_bigger,isyn_bigger = np.loadtxt('data_ex_3_4_bigger.csv',delimiter=',')
plt.plot(t,vsyn_smaller,t,vsyn_normal,t,vsyn_bigger)
plt.xlabel('t [s]')
plt.ylabel('$V_{syn}$ [V]')
plt.legend(['$V_{syn}$ - Smaller $I_{thr}$','$V_{syn}$ - Normal $I_{thr}$','$V_{syn}
plt.title('Fig. 7: Measured values of $V_{syn}$ as function of time for varying $I_
plt.grid()
plt.show()
plt.plot(t[1:],isyn_smaller[1:],t,isyn_normal,t,isyn_bigger)
plt.xlabel('t [s]')
plt.ylabel('C2F [Hz]')
plt.legend(['C2F$(I_{syn})$ - Smaller $I_{thr}$','C2F$(I_{syn})$ - Normal $I_{thr}$
plt.title('Fig. 8: Measured values of $I_{syn}$ as function of time for varying $I_
plt.grid()
plt.show()
```

# 3.5 Different pulse width

Repeat 3.1 with a smaller and a larger pulse width, compare the three curves in the same plot.

smaller width

```
pyplane.Coach.BiasType.N, \
   pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
N_pulses = 2 # for each trial, send 2 input pulses
N_samples_per_pulse = 10 # for each input pulse, sample 10 points
N_samples = N_pulses*N_samples_per_pulse
dT = 0.02 # delta t between the samples, DO NOT CHANGE
t = np.arange(N_samples)*dT
vsyn = np.zeros(N samples)
isyn = np.zeros(N_samples)
for k in range(N_pulses):
   p.send_coach_events([pyplane.Coach.generate_pulse_event()])
   for i in range(N_samples_per_pulse):
        vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
        inter=p.read c2f output(dT)
        isyn[k*N_samples_per_pulse+i] += inter[9]
import matplotlib.pyplot as plt
import numpy as np
plt.rcParams.update({'font.size': 15})
np.savetxt('data_ex_3_5_20.csv',[t,vsyn,isyn] , delimiter=',')
t, vsyn, isyn = np.loadtxt('data_ex_3_5_20.csv', delimiter=',')
plt.plot(t,vsyn,'-')
plt.xlabel('t [s]')
plt.ylabel('$V_{syn}$ [V]')
plt.legend(['$V_{syn}$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 1: Measured values of $V_{syn}$ as a function of time')
plt.grid()
plt.show()
plt.plot(t,isyn,'-')
plt.xlabel('t [s]')
plt.ylabel('C2F [Hz]')
plt.legend(['C2F$(I_{syn})$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')
plt.grid()
plt.show()
```

avg width

```
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.DPI_VTHR_N, \
    pyplane.Coach.BiasType.P, \
    pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.DPI_VWEIGHT_N, \
   pyplane.Coach.BiasType.N, \
    pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
    pyplane.Coach.BiasAddress.PEX_VTAU_N, \
   pyplane.Coach.BiasType.N, \
   pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
N_pulses = 2 # for each trial, send 2 input pulses
N_samples_per_pulse = 10 # for each input pulse, sample 10 points
N_samples = N_pulses*N_samples_per_pulse
dT = 0.02 # delta t between the samples, DO NOT CHANGE
t = np.arange(N samples)*dT
vsyn = np.zeros(N_samples)
isyn = np.zeros(N samples)
for k in range(N_pulses):
   p.send_coach_events([pyplane.Coach.generate_pulse_event()])
   for i in range(N samples per pulse):
        vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
        inter=p.read_c2f_output(dT)
        isyn[k*N_samples_per_pulse+i] += inter[9]
import matplotlib.pyplot as plt
import numpy as np
plt.rcParams.update({'font.size': 15})
np.savetxt('data_ex_3_5_100.csv',[t,vsyn,isyn] , delimiter=',')
t,vsyn,isyn = np.loadtxt('data ex 3 5 100.csv',delimiter=',')
plt.plot(t,vsyn,'-')
plt.xlabel('t [s]')
plt.ylabel('$V_{syn}$ [V]')
plt.legend(['$V_{syn}$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 1: Measured values of $V_{syn}$ as a function of time')
plt.grid()
plt.show()
plt.plot(t,isyn,'-')
plt.xlabel('t [s]')
plt.ylabel('C2F [Hz]')
plt.legend(['C2F$(I_{syn})$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')
plt.grid()
plt.show()
```

```
In [ ]: ## 3.1 Basic impulse response
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 25)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI VTHR N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VWEIGHT_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 100)])
        p.send coach events([pyplane.Coach.generate biasgen event()
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
        N_pulses = 2 # for each trial, send 2 input pulses
        N samples per pulse = 10 # for each input pulse, sample 10 points
        N_samples = N_pulses*N_samples_per_pulse
        dT = 0.02 # delta t between the samples, DO NOT CHANGE
        t = np.arange(N samples)*dT
        vsyn = np.zeros(N samples)
        isyn = np.zeros(N samples)
        for k in range(N_pulses):
            p.send_coach_events([pyplane.Coach.generate_pulse_event()])
            for i in range(N_samples_per_pulse):
                vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
                inter=p.read c2f output(dT)
                isyn[k*N samples per pulse+i] += inter[9]
        import matplotlib.pyplot as plt
        import numpy as np
        plt.rcParams.update({'font.size': 15})
        np.savetxt('data_ex_3_5_100.csv',[t,vsyn,isyn] , delimiter=',')
        t,vsyn,isyn = np.loadtxt('data_ex_3_5_100.csv',delimiter=',')
        plt.plot(t,vsyn,'-')
        plt.xlabel('t [s]')
        plt.ylabel('$V {syn}$ [V]')
        plt.legend(['$V_{syn}$'],bbox_to_anchor=(1.05, 1),loc='upper left')
        plt.title('Fig. 1: Measured values of $V_{syn}$ as a function of time')
        plt.grid()
        plt.show()
        plt.plot(t,isyn,'-')
```

```
plt.xlabel('t [s]')
plt.ylabel('C2F [Hz]')
plt.legend(['C2F$(I_{syn})$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')
plt.grid()
plt.show()
```

```
In [ ]: ## 3.1 Basic impulse response
        p.send coach events([pyplane.Coach.generate biasgen event()
            pyplane.Coach.BiasAddress.DPI_VTAU_P, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 25)])
        p.send coach events([pyplane.Coach.generate biasgen event()
            pyplane.Coach.BiasAddress.DPI VTHR N, \
            pyplane.Coach.BiasType.P, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 30)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.DPI_VWEIGHT_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I30nA, 200)])
        p.send_coach_events([pyplane.Coach.generate_biasgen_event(\
            pyplane.Coach.BiasAddress.PEX_VTAU_N, \
            pyplane.Coach.BiasType.N, \
            pyplane.Coach.BiasGenMasterCurrent.I60pA, 10)])
        N_pulses = 2 # for each trial, send 2 input pulses
        N_samples_per_pulse = 10 # for each input pulse, sample 10 points
        N_samples = N_pulses*N_samples_per_pulse
        dT = 0.02 # delta t between the samples, DO NOT CHANGE
        t = np.arange(N samples)*dT
        vsyn = np.zeros(N_samples)
        isyn = np.zeros(N_samples)
        for k in range(N pulses):
            p.send coach events([pyplane.Coach.generate pulse event()])
            for i in range(N_samples_per_pulse):
                vsyn[k*N_samples_per_pulse+i] += p.read_voltage(pyplane.AdcChannel.AOUT14)
                inter=p.read c2f output(dT)
                isyn[k*N_samples_per_pulse+i] += inter[9]
        import matplotlib.pyplot as plt
        import numpy as np
        plt.rcParams.update({'font.size': 15})
        np.savetxt('data_ex_3_5_200.csv',[t,vsyn,isyn] , delimiter=',')
        t,vsyn,isyn = np.loadtxt('data_ex_3_5_200.csv',delimiter=',')
        plt.plot(t,vsyn,'-')
        plt.xlabel('t [s]')
        plt.ylabel('$V_{syn}$ [V]')
```

```
plt.legend(['$V_{syn}$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 1: Measured values of $V_{syn}$ as a function of time')

plt.grid()
plt.show()

plt.plot(t,isyn,'-')

plt.xlabel('t [s]')
plt.ylabel('C2F [Hz]')
plt.legend(['C2F$(I_{syn})$'],bbox_to_anchor=(1.05, 1),loc='upper left')
plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')

plt.grid()
plt.show()
```

```
In [ ]: t,vsyn,isyn = np.loadtxt('data_ex_3_5_200.csv',delimiter=',')
        t1,vsyn1,isyn1 = np.loadtxt('data_ex_3_5_20.csv',delimiter=',')
        t2, vsyn2, isyn2 = np.loadtxt('data_ex_3_5_100.csv', delimiter=',')
        plt.plot(t,vsyn,'-',label='$Larger$')
        plt.plot(t1,vsyn1,'-',label='$Lower$')
        plt.plot(t2,vsyn2,'-',label='$Medium$')
        plt.xlabel('t [s]')
        plt.ylabel('$V_{syn}$ [V]')
        plt.legend(bbox_to_anchor=(1.05, 1),loc='upper left')
        plt.title('Fig. 1: Measured values of $V {syn}$ as a function of time')
        plt.grid()
        plt.show()
        plt.plot(t,isyn,'-',label='$Larger$')
        plt.plot(t1,isyn1,'-',label='$Lower$')
        plt.plot(t2,isyn2,'-',label='$Medium$')
        plt.xlabel('t [s]')
        plt.ylabel('C2F [Hz]')
        plt.legend(bbox_to_anchor=(1.05, 1),loc='upper left')
        plt.title('Fig. 2: Measured C2F values of $I_{syn}$ as a function of time')
        plt.grid()
```

```
In [ ]:
```