

#Load in necessary modules and packages.

```
import os
import numpy as np
import scipy.io.wavfile as sio_wav
import scipy.signal as sp_sig
from filters import
(erb_point,erb_space,centre_freqs,make_erb_filters,erb_filterbank,gamm
atone_analysis,pow_stft,hz2mel,mel2hz,mel_fb,mel_analysis)
import matplotlib.pyplot as plt
from scipy.fftpack import dct
from signal_utils import *
%matplotlib inline
import sounddevice as sd
import scipy.io
from scipy import signal
import keras
from keras.models import model_from_json
# from keras.utils import CustomObjectScope
from keras.initializers import glorot_uniform
from helper_ops import *
import warnings
warnings.filterwarnings("ignore")
```

#Main code framework to compare auditory model outputs.

#Sarah Verhulst, Deepak Baby, Arthur Van Den Broucke, UGent, 2021

General parameters

framelength_t = 0.25 # framelength in time = 250ms

#frameshift_t = 0.01 # frameshift in time = 10ms

L = 70. # specify the desired SPL of the input

fs_GT = 48e3 # GT model 48 kHz

fs_Con = 20e3 # CoNNear model 20 kHz

#Your code to Generate a Pure-tone goes here

*#Take note that the CoNNear model uses a context window of 256 samples
at both the entry*

*#aswell at the end, when making a stimulus, add zero's for 256 samples
(20 kHz sampling freq)*

*#to the stimulus to obtain the same output for the GT as the CoNNear
model.*

f = 440.0 # sine frequency, Hz, may be float

f = 50.0 # sine frequency, Hz, may be float

generate samples, note conversion to float32 array

```
y_GT = (np.sin(2 * np.pi * np.arange(fs_GT * framelength_t) * f /  
fs_GT))
```

```
y_Con = (np.sin(2 * np.pi * np.arange(fs_Con * framelength_t) * f /
```

```

fs_Con))

t_GT = np.linspace(0, 0.25, len(y_GT))
t_Con = np.linspace(0, 0.25, len(y_Con))

def concat_hanning(fs, time_ms, signal):

    samp_ms = int(fs / (1000 / time_ms)) # number of samples in that
    time span (10ms in our case)
    hann_w = np.hanning(samp_ms*2) # hanning window
    win_ones = np.ones((len(signal) - (samp_ms * 2)), dtype=int) #
    array of ones for the middle section
    concat = np.concatenate([np.concatenate([hann_w[:samp_ms],
    win_ones]), hann_w[samp_ms:]] # concatenating halves of the HW to the
    begining and end of the array of 1s

    return concat

HWin_GT = concat_hanning(fs_GT, 10, y_GT)
HWin_Con = concat_hanning(fs_Con, 10, y_Con)

mult_GT = np.multiply(y_GT, HWin_GT)
mult_Con = np.multiply(y_Con, HWin_Con)
pad = np.zeros(256)
padded_Con = np.concatenate((pad, HWin_Con, pad), axis=None)

#output = HWin

# plotting part of the stimulus
plt.figure(1)
plt.plot(t_GT, HWin_GT, label="Hanning window")
plt.plot(t_GT, y_GT, alpha=0.4, label="Pure tone")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.legend()
# plt.xlim((0, 0.02))
plt.title("Gammatone pure tone and Hanning window")
plt.show()

plt.figure(2)
plt.plot(t_GT, mult_GT, label="Filtered")
plt.plot(t_GT, y_GT, alpha=0.4, label="Pure tone")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.title("Gammatone pure tone and filtered")
plt.legend()
# plt.xlim((0, 0.02))

```

```

plt.figure(3)
plt.plot(t_Con, HWin_Con, label="Hanning window")
plt.plot(t_Con, y_Con, alpha=0.4, label="Pure tone")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.legend()
plt.title("Connear pure tone and Hanning window")
# plt.xlim((0, 0.02))
plt.show()

```

```

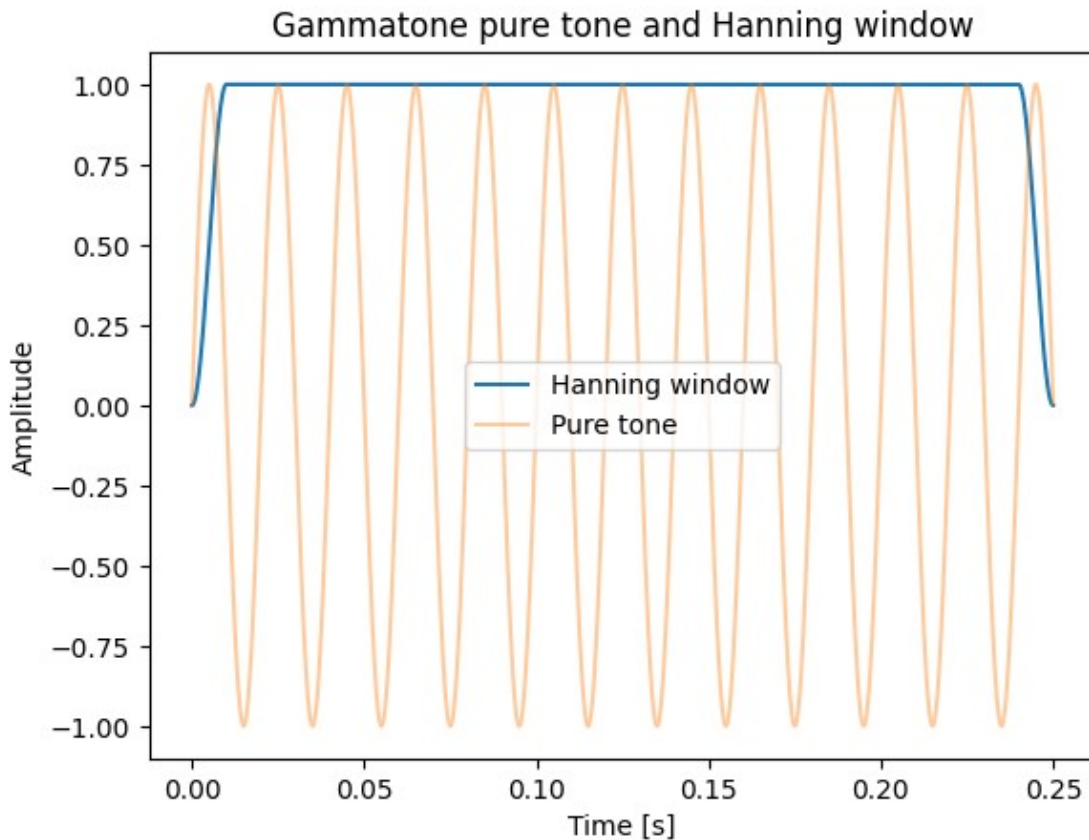
plt.figure(4)
plt.plot(t_Con, mult_Con, label="Filtered")
plt.plot(t_Con, y_Con, alpha=0.4, label="Pure tone")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.title("Connear pure tone and filtered")
plt.legend()
# plt.xlim((0, 0.02))

```

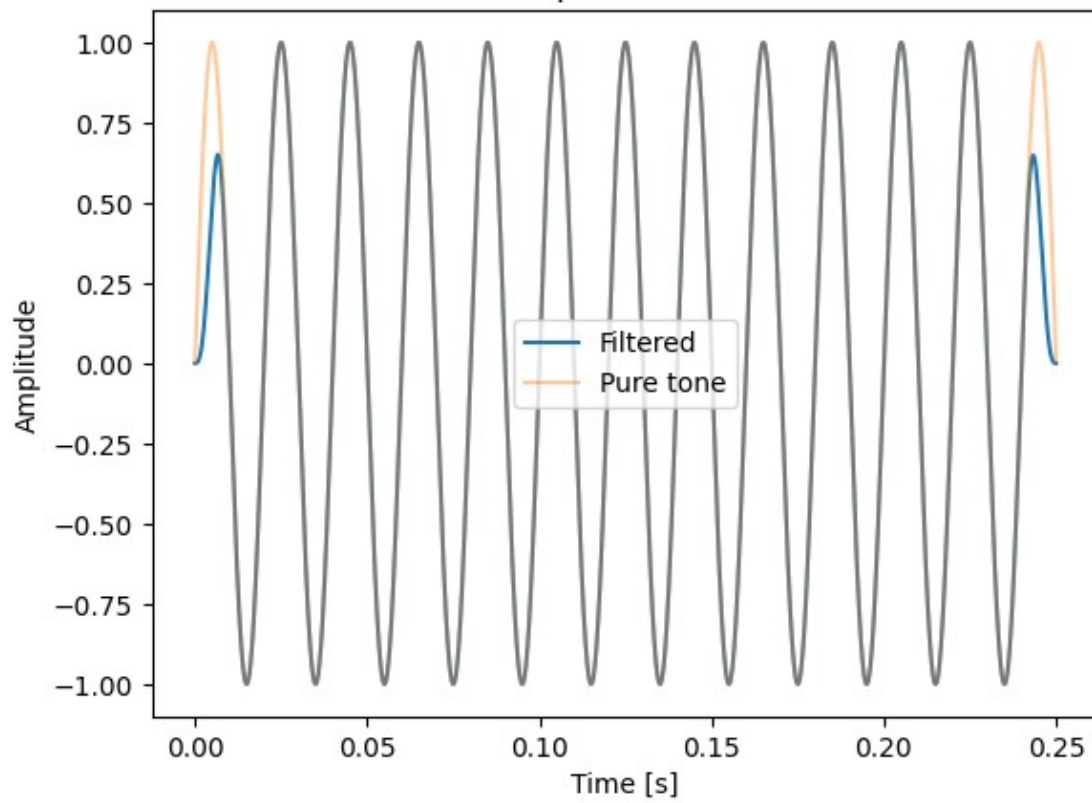
```

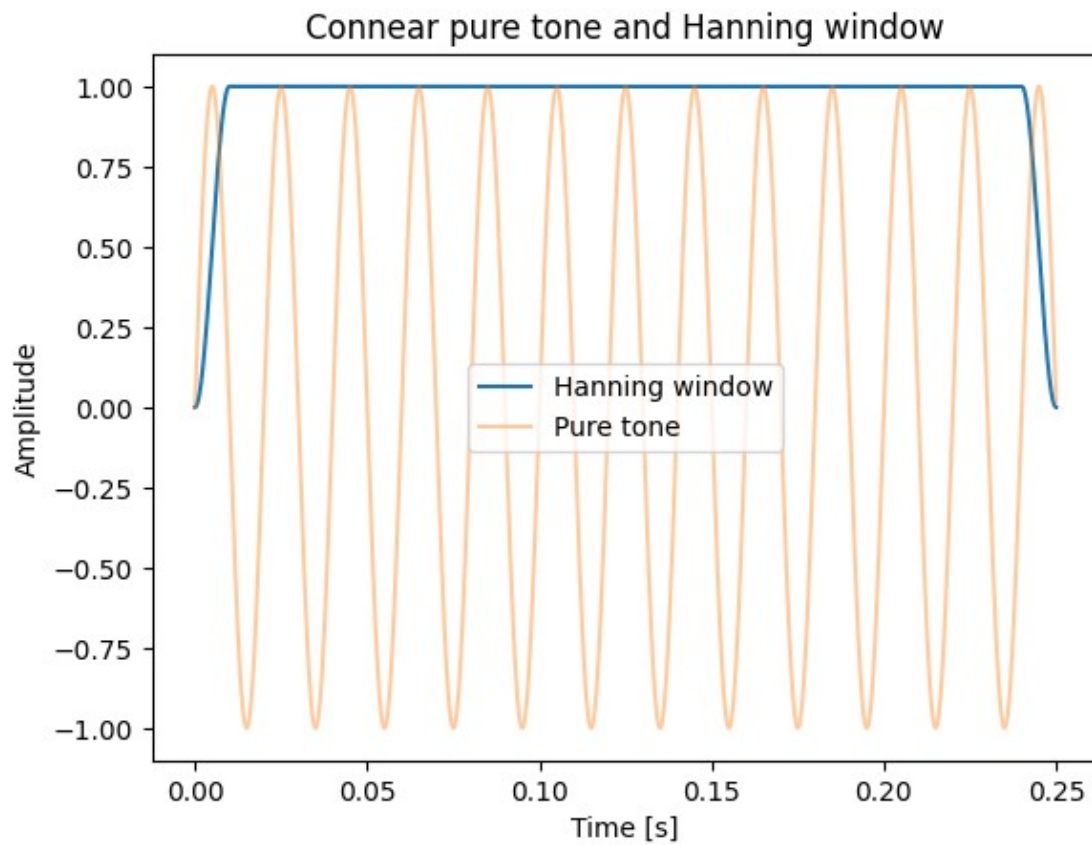
# sd.play(y_GT, fs_GT)
# sd.play(mult_GT, fs_GT)
# sd.play(y_Con, fs_Con)
# sd.play(mult_Con, fs_Con)

```

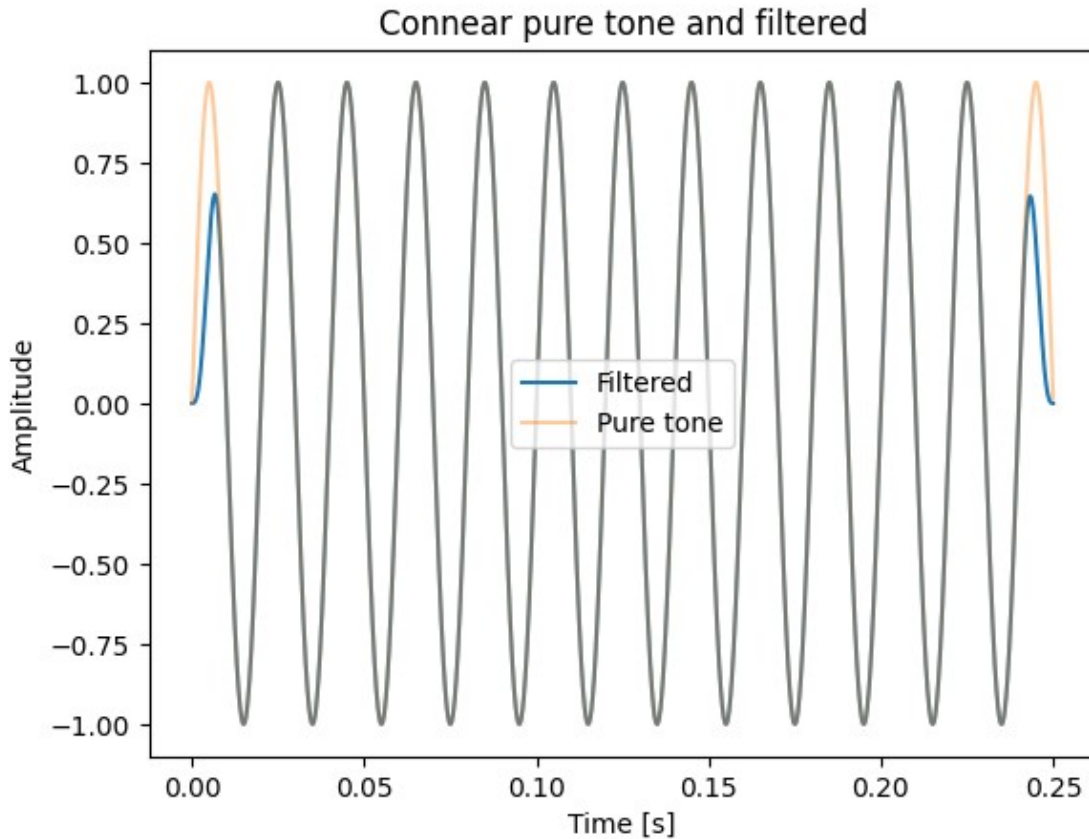


Gammatone pure tone and filtered





<matplotlib.legend.Legend at 0x22a91043a60>

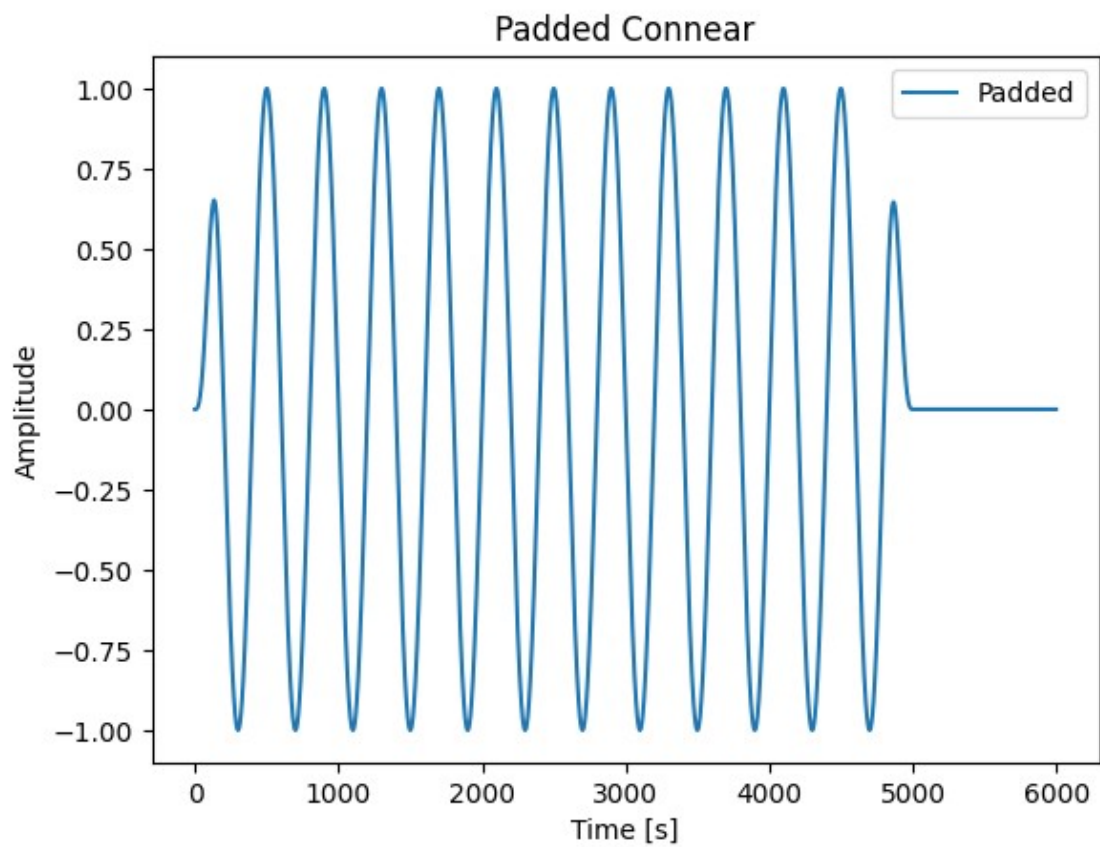


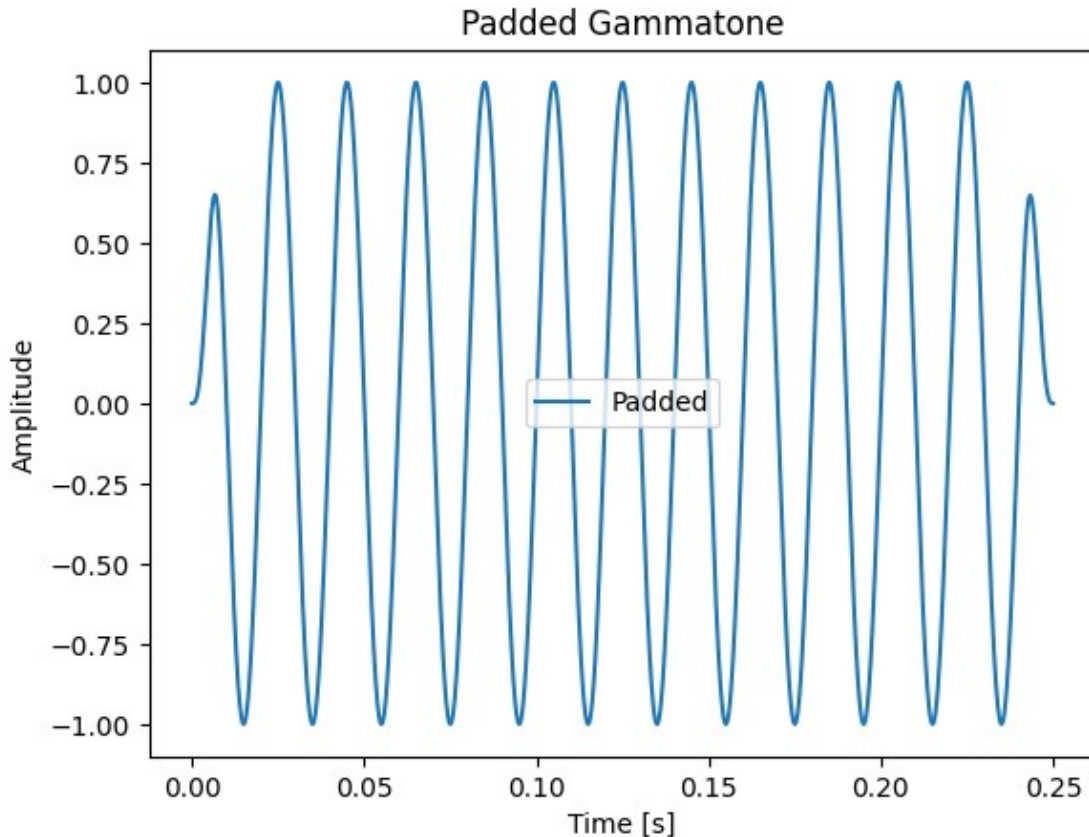
```
#concatenate the stimulus with some silence afterwards to see model
ringdown
silence_Con = np.zeros(int(fs_Con / (1000 / 50))) # + 50ms of 0s for
Connear

padded_Con = np.concatenate([mult_Con, silence_Con])
t_pad_Con = np.arange(len(padded_Con)) # time with the 0 padding for
Connear

plt.plot(t_pad_Con, padded_Con, label="Padded")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.title("Padded Connear")
plt.legend()
plt.show()

plt.plot(t_GT, mult_GT, label="Padded")
plt.xlabel("Time [s]")
plt.ylabel("Amplitude")
plt.title("Padded Gammatone")
plt.legend()
plt.show()
```





```
##Load in CoNNear model
json_file = open("connear/Gmodel.json", "r")
loaded_model_json = json_file.read()
json_file.close()
connear = model_from_json(loaded_model_json)
connear.load_weights("connear/Gmodel.h5")
connear.summary()

mult_GT = adjust_spl(mult_GT, L)
# parameters for gammatone analysis
fmin = 50. #lowest frequency simulated for GT
numbands = 64 #number of GT bands
# fs_Con = 20e3 # CoNNear requires 20kHz

# Parameters for the cochleagram figures
framelength_t = 0.025/4 # framelength in time
frameshift_t = 0.01/4 # frameshift in time
#for the GT
framelength_gt = int(framelength_t * fs_GT)
frameshift_gt = int(frameshift_t * fs_GT)

#for the CoNNear model
framelength_Con = int(framelength_t * fs_Con) # framelength_nn =
framelength_Con
```



```

frameshift_Con = int(frameshift_t * fs_Con)

# Calculate the gammatone model and cochleagrams
gt_out = gammatone_analysis(mult_GT, fs_GT, numbands, fmin)
gt_cochleagram = cochleagram(gt_out['bmm'], framelength_gt,
frameshift_gt)
t_gt = np.arange(len(mult_GT)) / fs_GT

# Calculate the CoNNear model and cochleagrams
print("Resampling signal to " + str(fs_Con) + " Hz")
x_Con = sp_sig.resample_poly(mult_GT, fs_Con, fs_GT)
x_Con = np.expand_dims(x_Con, axis=0)
x_Con = np.expand_dims(x_Con, axis=2)
x_Con = x_Con[:, 0:5504, :]
nn_out = connear.predict(x_Con)
nn_out = nn_out[0,:,:]
nn_cochleagram = cochleagram(nn_out.T, int(framelength_t * fs_Con),
int(frameshift_t * fs_Con))
# t_Con = np.arange(len(x_Con)) / fs_Con
t_Con = np.arange(x_Con.shape[1]) / fs_Con
# print(f"shape axis 1 of x_Con: {x_Con.shape[1]}")

```

Model: "model_2"

Layer (type)	Output Shape	Param #
audio_input (InputLayer)	[(None, None, 1)]	0
model_1 (Functional)	(None, None, 201)	11689984

```

=====
Total params: 11,689,984
Trainable params: 11,689,984
Non-trainable params: 0

```

Resampling signal to 20000.0 Hz

```

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-----
ValueError                                Traceback (most recent call
last)

```

```

Cell In[13], line 37
      35 x_Con = np.expand_dims(x_Con, axis=2)
      36 x_Con = x_Con[:, 0:5504, :]
--> 37 nn_out = connear.predict(x_Con)
      38 nn_out = nn_out[0,:,:]
      39 nn_cochleagram = cochleagram(nn_out.T, int(framelength_t *
fs_Con), int(frameshift_t * fs_Con))

```

File c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-

```

packages\keras\utils\traceback_utils.py:70, in
filter_traceback.<locals>.error_handler(*args, **kwargs)
    67     filtered_tb = _process_traceback_frames(e.__traceback__)
    68     # To get the full stack trace, call:
    69     # `tf.debugging.disable_traceback_filtering()`
--> 70     raise e.with_traceback(filtered_tb) from None
    71 finally:
    72     del filtered_tb

```

File ~\AppData\Local\Temp__autograph_generated_file5zyg5444.py:15, in
outer_factory.<locals>.inner_factory.<locals>.tf__predict_function(iterator)

```

    13 try:
    14     do_return = True
--> 15     retval_ = ag__.converted_call(ag__.ld(step_function),
(ag__.ld(self), ag__.ld(iterator)), None, fscope)
    16 except:
    17     do_return = False

```

ValueError: in user code:

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\engine\training.py", line 2137, in
predict_function *

```

    return step_function(self, iterator)

```

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\engine\training.py", line 2123, in step_function
**

```

    outputs = model.distribute_strategy.run(run_step,
args=(data,))

```

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\engine\training.py", line 2111, in run_step **
 outputs = model.predict_step(data)

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\engine\training.py", line 2079, in predict_step
 return self(x, training=False)

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\utils\traceback_utils.py", line 70, in
error_handler

```

    raise e.with_traceback(filtered_tb) from None

```

File "c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-packages\keras\backend.py", line 3572, in concatenate
 return tf.concat([to_dense(x) for x in tensors], axis)

ValueError: Exception encountered when calling layer
'concatenate_1' (type Concatenate).

Dimension 1 in both shapes must be equal, but are 626 and 625.
Shapes are [?,626] and [?,625]. for '{{node
model_2/model_1/concatenate_1/concat}} = ConcatV2[N=2, T=DT_FLOAT,

```
Tidx=DT_INT32](model_2/model_1/activation_5/Tanh,
model_2/model_1/conv1d_3/Conv1D/Squeeze,
model_2/model_1/concatenate_1/concat/axis)' with input shapes:
[?,626,128], [?,625,128], [] and with computed input tensors: input[2]
= <2>.
```

```
Call arguments received by layer 'concatenate_1' (type
Concatenate):
  • inputs=['tf.Tensor(shape=(None, 626, 128), dtype=float32)',
'tf.Tensor(shape=(None, 625, 128), dtype=float32)']
```

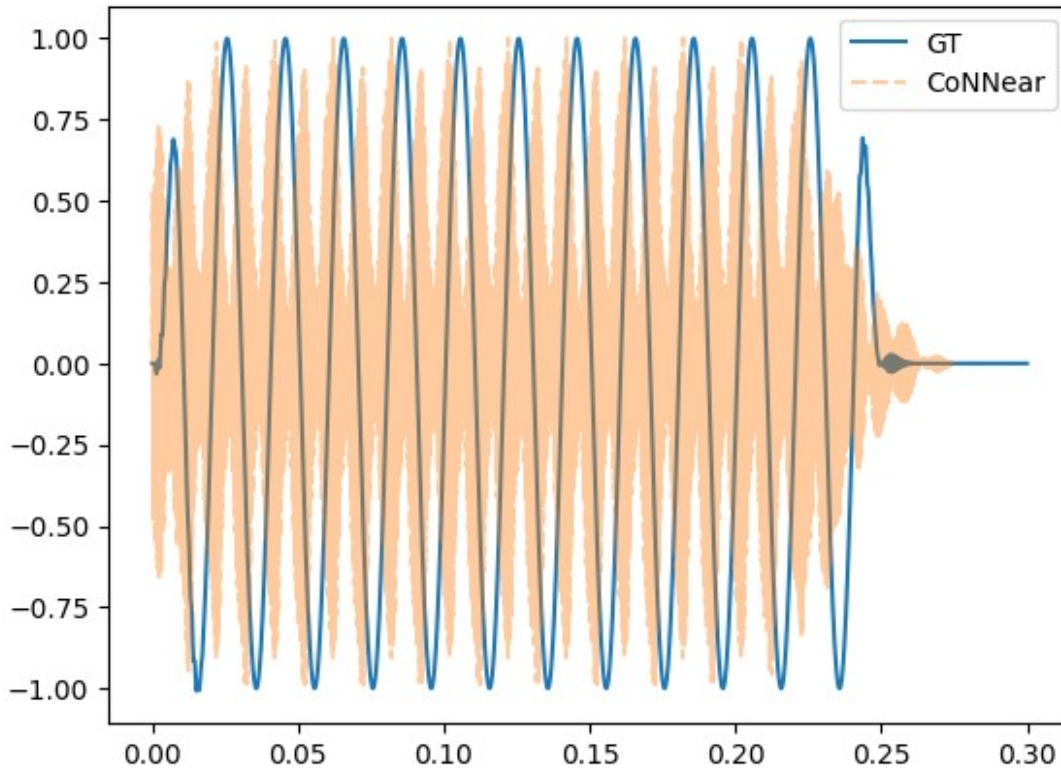
```
#The indexes belonging to the 1 kHz frequency channels
#You can modify some parts of this code to see the response to a
different CF channel
Nch,N = np.shape(gt_out['bmm'])
Nch_nn,N_nn= np.shape(nn_out)
Bch_gt = np.nonzero(gt_out['cf']<1000) #get the CF channels with
values < 1000 Hz
Bch_gt
Ch1k_gt = int(42)
Ch1k_nn = int(78) # CF channels with values < 1000 Hz for CoNNear

gt = np.zeros((Nch, N)) #copy the data so we can work with it
gt = gt_out['bmm']

nn = np.zeros((Nch_nn, N_nn)) #copy the data so we can work with it
nn = nn_out.T

#get the 1kHz-CF time-domain signal vs energy signal in specific bins
gt_1k = gt[Ch1k_gt,:] #time domain signal gt
nn_1k = nn[Ch1k_nn,:] #gt energy in 1-kHz channel, when used as
preprocessing for Machine Hearing

plt.figure()
plt.plot(t_gt, gt_1k/max(gt_1k))
plt.plot(t_Con[:len(nn_1k)], nn_1k/max(nn_1k), '--', alpha=0.4)
plt.legend(['GT','CoNNear'])
#plt.xlim((0.1, 0.12))
plt.show()
```



```

#Generate a cochlear excitation pattern
# 1. get the rms energy of the signals (for each central frequency)
# 2. plot them: x-axis -> central frequencies; y-axis -> RMS value
central_gt = gt_out['cf']
central_nn = []

with open('cf.txt') as f:
    for line in f:
        central_nn.append(float(line))
# central_nn = np.array(central_nn) * 1000 # conn in kHz

def get_rms(freqs):
    suma = np.sum([x**2 for x in freqs])
    RMS = np.sqrt( (1 / (len(freqs))) * suma )

    # STILL NEED TO NORMALIZE DIVIDING BY THE MAX VALUE (or the last?)

    return RMS

rms_gt = get_rms(central_gt)
rms_nn = get_rms(central_nn)

plt.plot(central_gt, rms_gt)
plt.title("RMS Gamatone")

```

```
plt.xlabel("Central frequencies")
plt.ylabel("RMS")
plt.show()
```

```
-----
-----
ValueError                                Traceback (most recent call
last)
```

```
Cell In[8], line 22
     18 rms_gt = get_rms(central_gt)
     19 rms_nn = get_rms(central_nn)
--> 22 plt.plot(central_gt, rms_gt)
     23 plt.title("RMS Gamatone")
     24 plt.xlabel("Central frequencies")
```

```
File c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-
packages\matplotlib\pyplot.py:2785, in plot(scalex, scaley, data,
*args, **kwargs)
```

```
    2783 @_copy_docstring_and_deprecators(Axes.plot)
    2784 def plot(*args, scalex=True, scaley=True, data=None,
**kwargs):
-> 2785     return gca().plot(
    2786         *args, scalex=scalex, scaley=scaley,
    2787         **({"data": data} if data is not None else {}),
**kwargs)
```

```
File c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-
packages\matplotlib\axes\_axes.py:1688, in Axes.plot(self, scalex,
scaley, data, *args, **kwargs)
```

```
    1445 """
    1446 Plot y versus x as lines and/or markers.
    1447
    1448 (...)
    1685 (``'green'``) or hex strings (``'#008000'``).
    1686 """
    1687 kwargs = cbook.normalize_kwargs(kwargs, mlines.Line2D)
-> 1688 lines = [*self._get_lines(*args, data=data, **kwargs)]
    1689 for line in lines:
    1690     self.add_line(line)
```

```
File c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-
packages\matplotlib\axes\_base.py:311, in
_process_plot_var_args.__call__(self, data, *args, **kwargs)
```

```
    309     this += args[0],
    310     args = args[1:]
--> 311 yield from self._plot_args(
    312     this, kwargs, ambiguous_fmt_datakey=ambiguous_fmt_datakey)
```

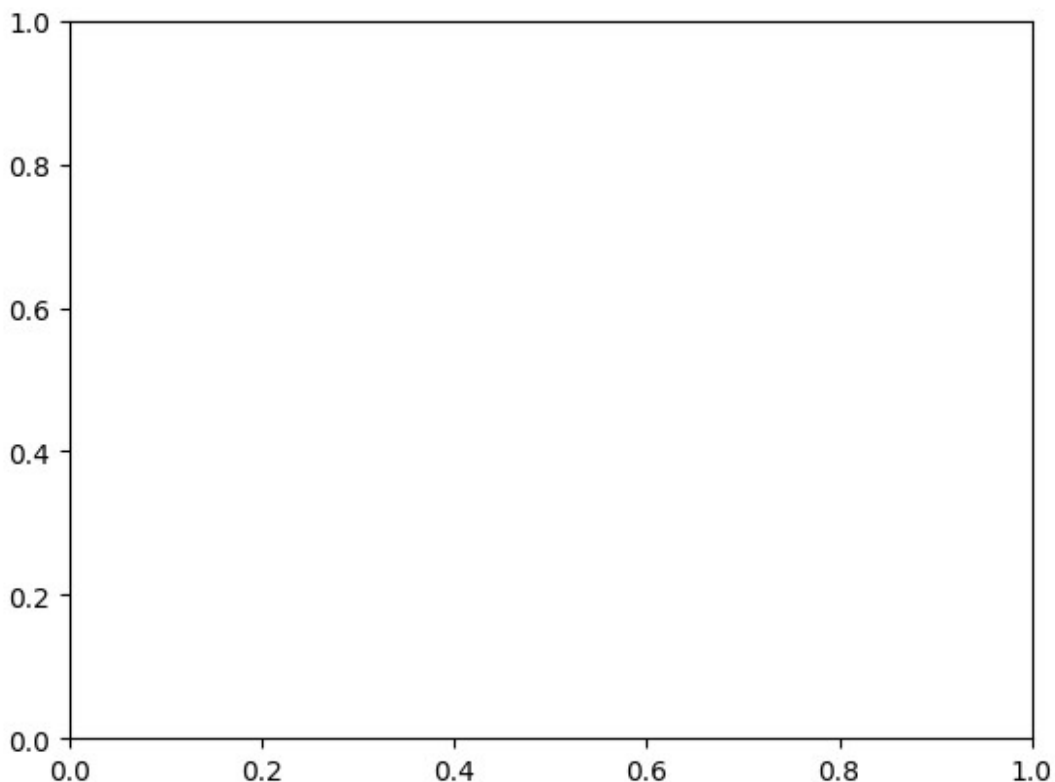
```
File c:\Users\cesar\AppData\Local\Programs\Python\Python310\lib\site-
packages\matplotlib\axes\_base.py:504, in
```

```

_process_plot_var_args._plot_args(self, tup, kwargs, return_kwargs,
ambiguous_fmt_datakey)
    501     self.axes.yaxis.update_units(y)
    503 if x.shape[0] != y.shape[0]:
--> 504     raise ValueError(f"x and y must have same first dimension,
but "
    505                       f"have shapes {x.shape} and {y.shape}")
    506 if x.ndim > 2 or y.ndim > 2:
    507     raise ValueError(f"x and y can be no greater than 2D, but
have "
    508                       f"shapes {x.shape} and {y.shape}")

```

ValueError: x and y must have same first dimension, but have shapes (64,) and (1,)



```

#Generate a click stimulus C_gt and C_nn: your code goes here
#outputs C_gt and C_nn as well as the time vectors: t_nn and t_gt
plt.figure()
plt.plot(t_gt,C_gt)
plt.plot(t_nn,C_nn)

```

```

#run the stimulus for different levels through the model
L_list=np.arange(10, 100, 10)
Cs_gt=np.zeros((Nch, N_gt, len(L_list)))
Cs_nn=np.zeros((Nch_nn, len(C_nn), len(L_list)))
Ps =np.zeros((N_gt, len(L_list)))

```

```

nCh_1k = 42 #to write out the 1-kHz channel, and example is only made
for the GT model here
#you should add corresponding code for the CoNNear model
for nL,L in enumerate(L_list):
    x = adjust_spl(C_gt, L)
    result = gammatone_analysis(x, fs, numbands, fmin)
    Cs_gt[:, :, nL] = result['bmm']
    Ps[:, nL] = (2*abs(np.fft.fft(result['bmm']
[nCh_1k, :]))/result['bmm'].shape[1])**2

plt.figure()
plt.plot(t_gt, Cs_gt[nCh_1k, :, :])

# Frequency domain
plt.figure()
freq_vect = np.fft.fftfreq(N_gt, d=1/fs)
plt.plot(freq_vect[:int(N_gt/2)], 10*np.log10(Ps[:int(N_gt/2)]))
plt.xlim((0, 8000))

```