

Filtered Projections & Reconstruction from filtered projections

```
In [1]: import sys, os
import numpy as np
import cv2
import math
import matplotlib.pyplot as plt
sys.path.append(os.path.join(os.getcwd(), 'modules'))
from RadonUtils import backprojection2
```

```
In [2]: fname_sino = './sinograms/sinogram_stripes.npz'
npzData = np.load(fname_sino)
print(f"npzData.files: {npzData.files}")
```

```
npzData.files: ['N_theta', 'theta_vec_deg', 't_vec', 'sinogram']
```

```
In [3]: # get the data
N_theta = npzData['N_theta']
theta_vec_deg = npzData['theta_vec_deg']
t_vec = npzData['t_vec']
sinogram = npzData['sinogram']
np.nan_to_num(sinogram, copy=False)
print(f"sinogram.shape : {sinogram.shape}")
# rows: phase starting at 0
# columns : t values starting at lowest t value := t_vec[0]

print(f"t_vec[0] : {t_vec[0]}; t_vec[-1] : {t_vec[-1]}")
```

```
sinogram.shape : (400, 501)
```

```
t_vec[0] : -4.242640687119285; t_vec[-1] : 4.242640687119285
```

Todo

```
In [4]: # plotting a projection (fixed angle; all t values)
nrows = [0, 100, 150, 200, 250, 300, 350] # defines all angles for which projection
ds = (t_vec[-1]-t_vec[0])/len(t_vec) # sampling spacing
f_fft = np.fft.fftshift(np.fft.fftfreq(sinogram.shape[1], d=ds))

# the Ram Lak filter in the frequency domain and time domain
# H_ram_lak = np.abs(f_fft)
H_ram_lak = np.abs(np.fft.fftfreq(sinogram.shape[1], d=ds))
# the impulse response
imp_ram_lak = np.real(np.fft.ifft(H_ram_lak))

H_sin_ram_lak = np.fft.fftshift(np.fft.fftshift(H_ram_lak) * np.abs(np.sin(2 * np.p

fig1 = plt.figure(1, figsize=[12, 8])
ax_f11 = fig1.add_subplot(3, 1, 1)
for nrow in nrows:
    ax_f11.plot(t_vec, sinogram[nrow, :], linewidth=0.5, label=f"nrow: {nrow}")
```

```

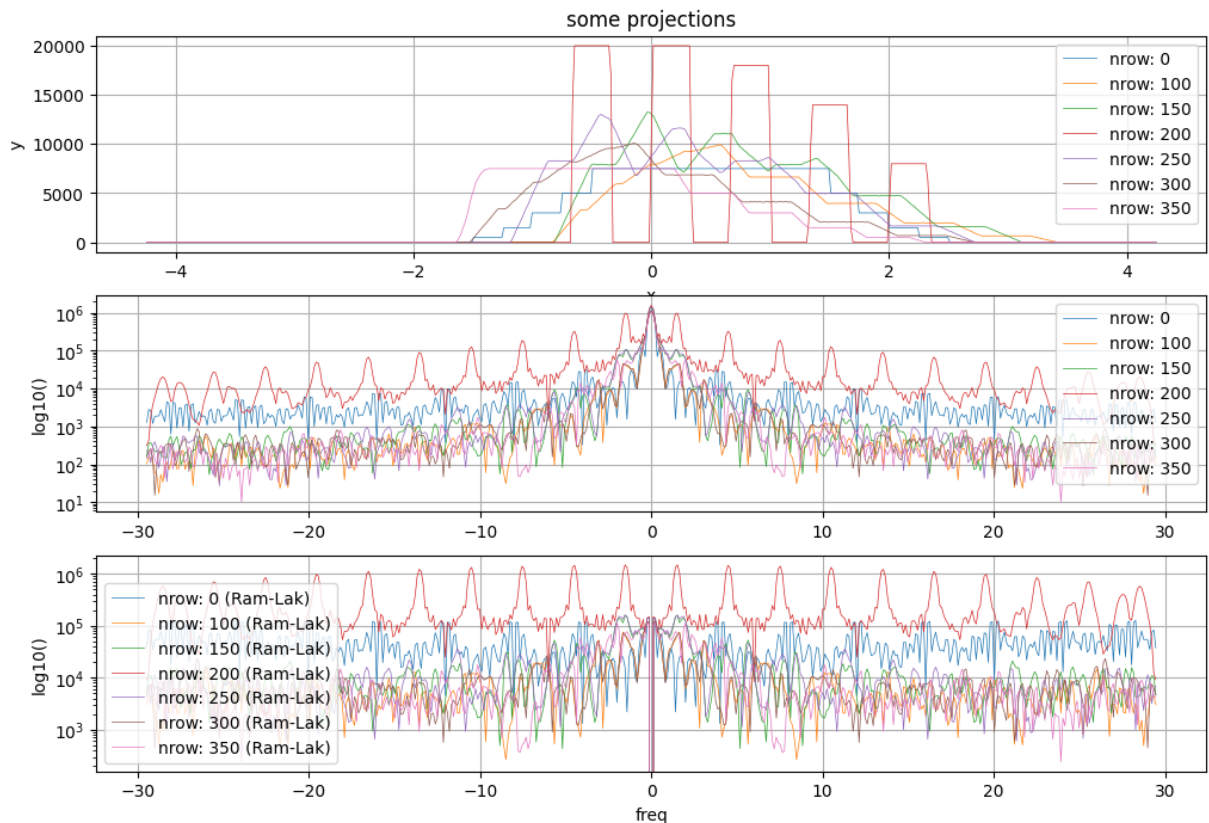
ax_f11.grid(True)
ax_f11.set_ylabel('y')
ax_f11.set_xlabel('x')
ax_f11.legend()
ax_f11.set_title('some projections')

ax_f12 = fig1.add_subplot(3, 1, 2)
for nrow in nrows:
    dft_projection = np.fft.fftshift(np.fft.fft(sinogram[nrow, :]))
    ax_f12.semilogy(f_fft, np.abs(dft_projection), linewidth=0.5, label=f"nrow: {nr
ax_f12.grid(True)
ax_f12.set_ylabel('log10()')
ax_f12.legend()
#ax_f12.set_title('DFTs of a projections');

ax_f13 = fig1.add_subplot(3, 1, 3)
for nrow in nrows:
    dft_projection = np.fft.fftshift(np.fft.fft(sinogram[nrow, :]) * H_ram_lak)
    ax_f13.semilogy(f_fft, np.abs(dft_projection), linewidth=0.5, label=f"nrow: {nr
ax_f13.grid(True)
ax_f13.set_ylabel('log10()')
ax_f13.set_xlabel('freq')
ax_f13.legend()

```

Out[4]: <matplotlib.legend.Legend at 0x1d0d7c50c10>



```

In [5]: fig2 = plt.figure(2, figsize=[10, 10])
ax_f21 = fig2.add_subplot(3, 1, 1)
ax_f21.plot( f_fft, np.fft.fftshift(H_ram_lak), linewidth=0.5, label=f"Ram-Lak filt
ax_f21.plot( f_fft, np.fft.fftshift(H_sin_ram_lak), linewidth=0.5, label=f"Ram-Lak
ax_f21.grid(True)

```

```

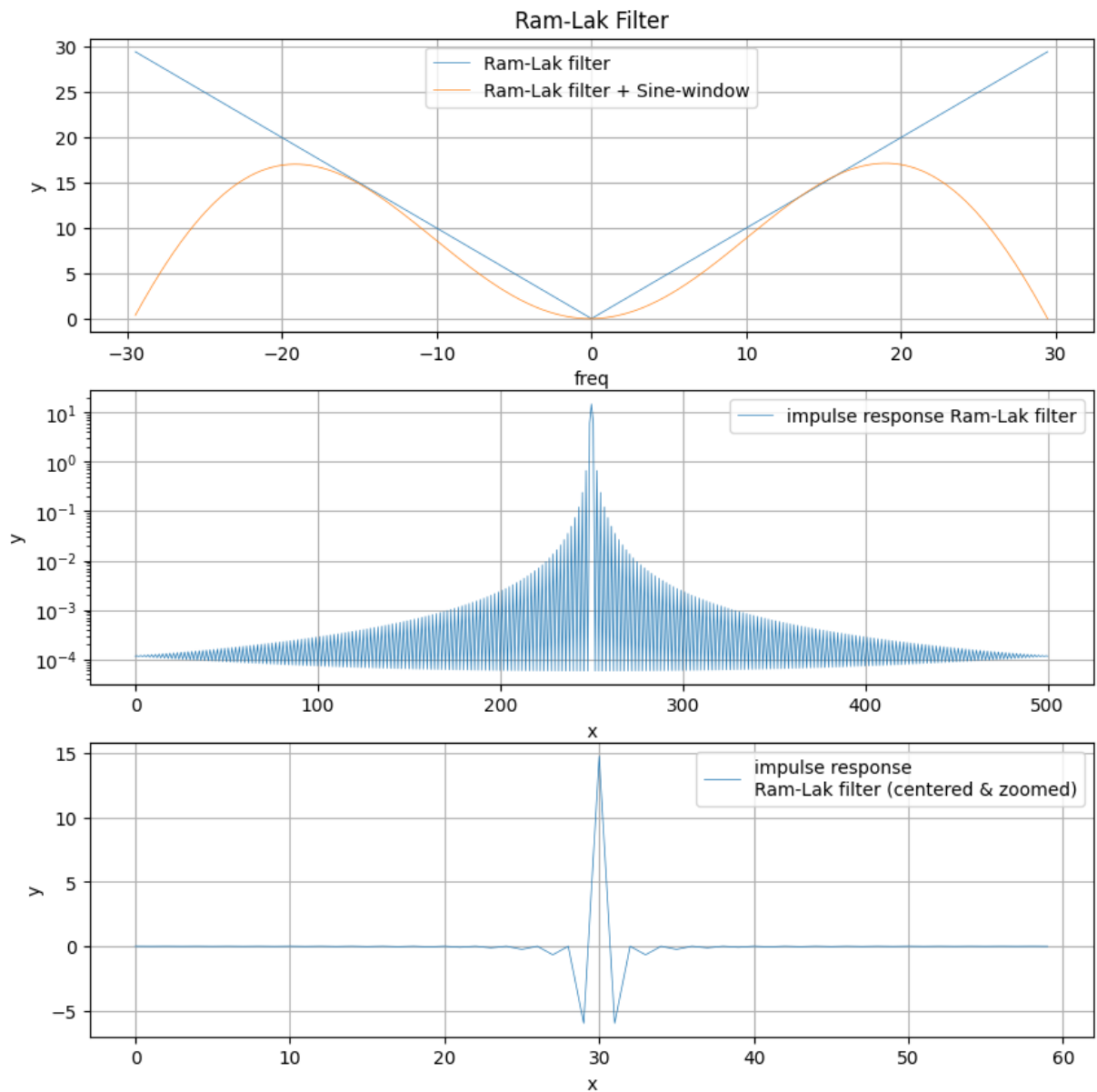
ax_f21.set_ylabel('y')
ax_f21.set_xlabel('freq')
ax_f21.legend()
ax_f21.set_title('Ram-Lak Filter')

ax_f22 = fig2.add_subplot(3, 1, 2)
ax_f22.semilogy(np.fft.fftshift(np.abs(imp_ram_lak)), linewidth=0.5, label=f"impuls
#ax_f22.plot(imp_ram_lak[0:20], linewidth=0.5, label=f"impulse response Ram-Lak fil
ax_f22.grid(True)
ax_f22.set_ylabel('y')
ax_f22.set_xlabel('x')
ax_f22.legend()

ax_f23 = fig2.add_subplot(3, 1, 3)
ax_f23.plot(np.fft.fftshift(imp_ram_lak)[220:280], linewidth=0.5, label="impulse re
ax_f23.grid(True)
ax_f23.set_ylabel('y')
ax_f23.set_xlabel('x')
ax_f23.legend()

```

Out[5]: <matplotlib.legend.Legend at 0x1d0da285b10>



A filtered Sinogram

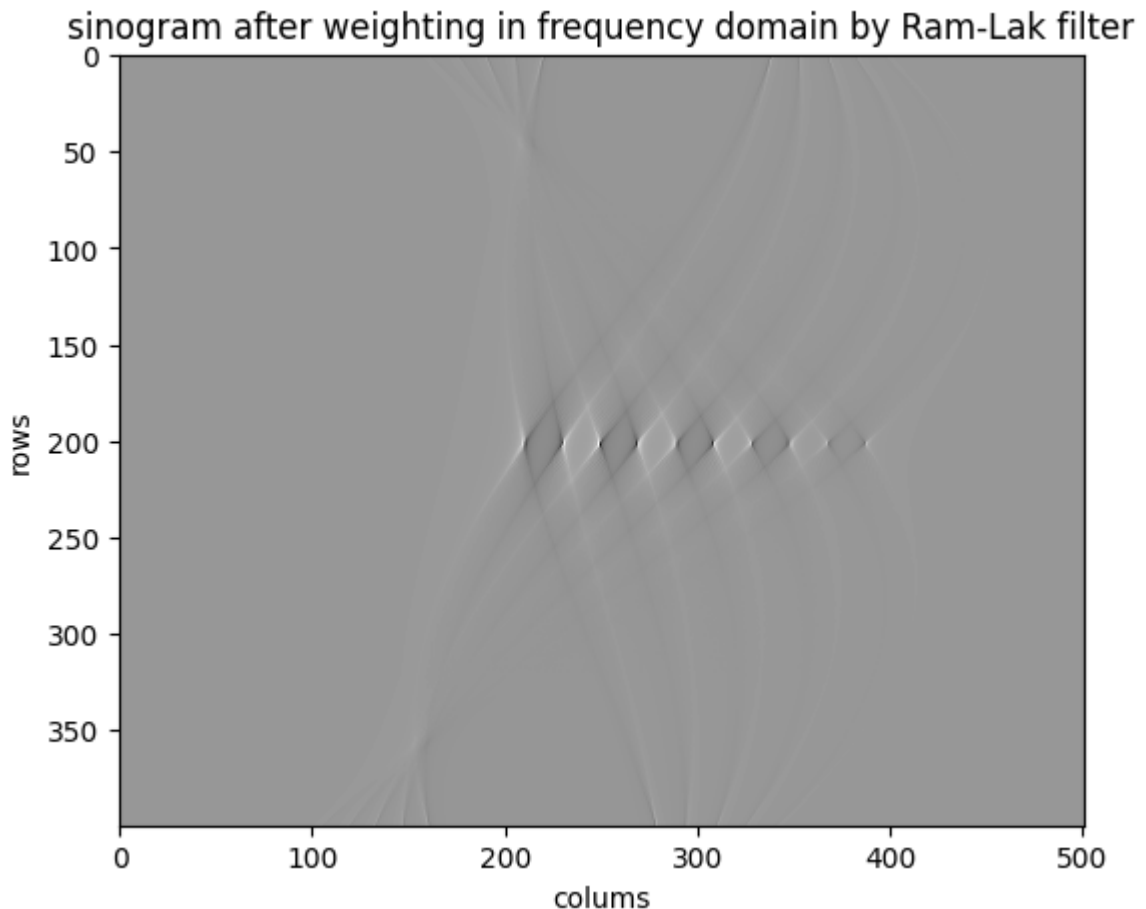
Each projection (row) of the sinogram is transformed to frequency domain, filtered by Ram-Lak filter and transformed back into signal domain.

```
In [6]: # initialize filtered sinogram
sinogram_f = np.zeros_like(sinogram)
nc = sinogram.shape[1]
if (nc % 2) == 1:
    n2 = (nc - 1) // 2
else:
    sys.exit('not implemented for even numbers')

# for each projection angle filter in frequency domain and transform back to signal
for row in range(sinogram.shape[0]):
    sinogram_row = sinogram[row, :]
```

```
sino_f_tmp = np.real(np.fft.ifft(np.fft.fft(np.fft.fftshift(sinogram_row)) * H_
sinogram_f[row, :] = np.fft.fftshift(sino_f_tmp)
```

```
In [7]: fig3 = plt.figure(3, figsize=[7, 5])
ax_f31 = fig3.add_subplot(1, 1, 1)
# plot of image
ax_f31.imshow(sinogram_f, cmap='Greys' )
ax_f31.set_ylabel('rows')
ax_f31.set_xlabel('columns')
ax_f31.set_title('sinogram after weighting in frequency domain by Ram-Lak filter');
```



Reconstruction by Backprojection

```
In [8]: # bounding box of image
x_min = t_vec[0]
x_max = t_vec[-1]
y_min = x_min
y_max = x_max

# nr pixels of image
Nx = 800
Ny = 800
x_vec = np.linspace(x_min, x_max, Nx)
y_vec = np.linspace(y_min, y_max, Ny)
```

```
In [9]: # initialise
img_fbp = np.zeros( (Ny, Nx), dtype=np.float64)
yv = np.flip(y_vec)

# iterate over angles
for theta_index, theta_deg in enumerate(theta_vec_deg):
    phi_rad = math.radians(theta_deg)
    cos_v = math.cos(phi_rad)
    sin_v = math.sin(phi_rad)

    # iterate over image rows
    for nr in range(Ny):
        yval = yv[nr]
        t_values = x_vec * cos_v + yval * sin_v

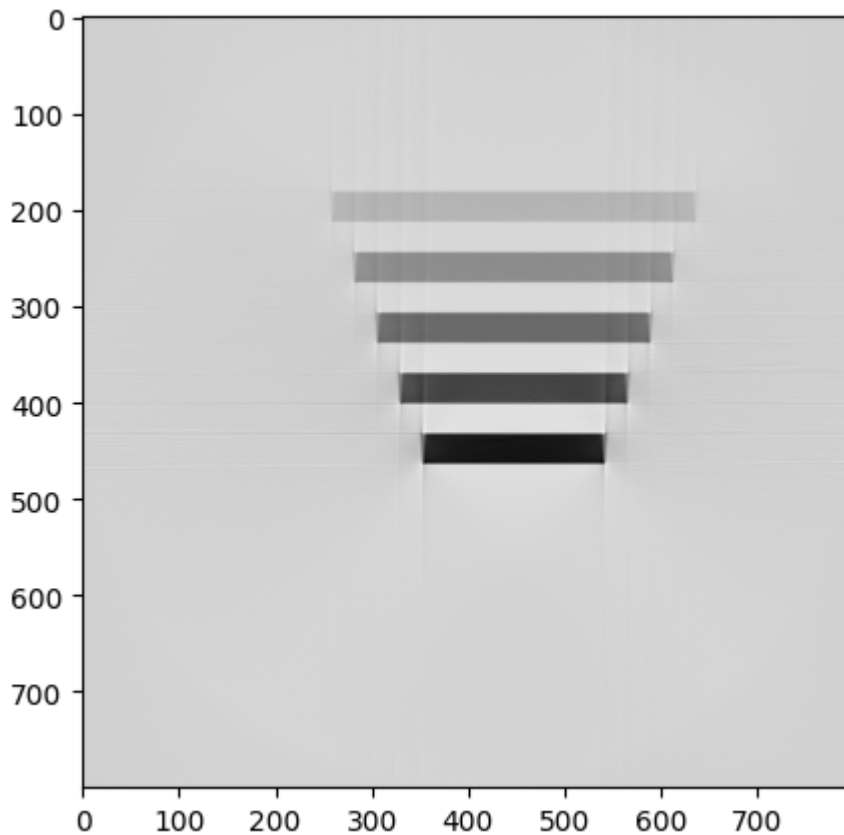
        sino_theta = sinogram_f[theta_index, :]
        # interpolate
        proj_i = np.interp(t_values, t_vec, sino_theta, left=0, right=0)
        img_fbp[nr, :] = img_fbp[nr, :] + proj_i
```

```
In [10]: print(f"np.min(img_fbp): {np.min(img_fbp)}; np.max(img_fbp): {np.max(img_fbp)}")

np.min(img_fbp): -525586.7969967091; np.max(img_fbp): 1278422.0232389867
```

```
In [11]: fig5 = plt.figure(5, figsize=[7, 5])
ax_f51 = fig5.add_subplot(1, 1, 1)
# plot of image
ax_f51.imshow(img_fbp, cmap='Greys' )
```

```
Out[11]: <matplotlib.image.AxesImage at 0x1d0dc0ca3d0>
```



```
In [12]: fname_sino = './sinograms/sinogram_trees.npz'
npzData = np.load(fname_sino)
print(f"npzData.files: {npzData.files}")
```

```
npzData.files: ['N_theta', 'theta_vec_deg', 't_vec', 'sinogram']
```

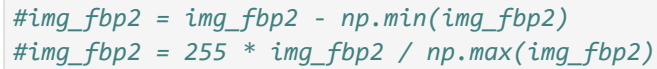
```
In [13]: # get data and initialize filtered sinogram
N_theta = npzData['N_theta']
theta_vec_deg = npzData['theta_vec_deg']
t_vec = npzData['t_vec']
sinogram = npzData['sinogram']
np.nan_to_num(sinogram, copy=False)

# H_ram_lak = np.abs(f_fft)
ds = (t_vec[-1]-t_vec[0])/len(t_vec) # sampling spacing
nrows, ncols = sinogram.shape
H_ram_lak = np.abs(np.fft.fftfreq(ncols, d=ds))

# bounding box of image
x_min = t_vec[0]
x_max = t_vec[-1]
y_min = x_min
y_max = x_max

# nr pixels of image
Nx = 2000
Ny = 1500

img_fbp2, sinogram_f2 = backprojection2(sinogram, x_min, x_max, y_min, y_max, Nx, N
```

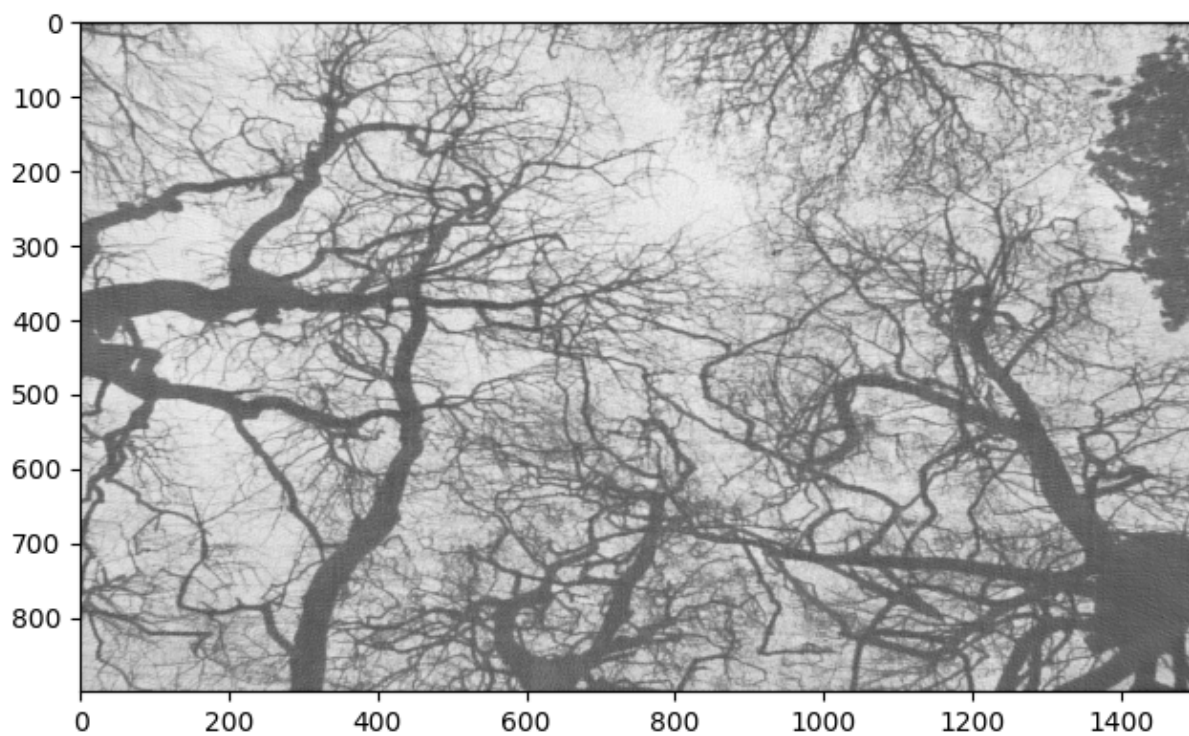
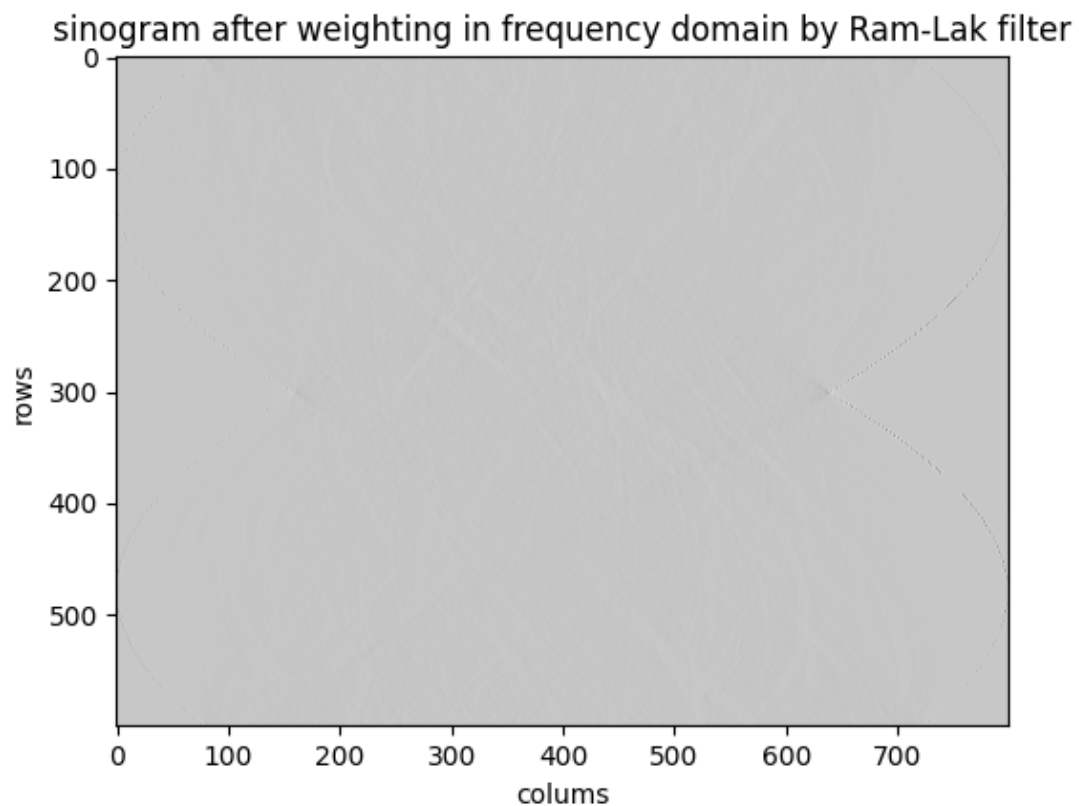
```
#img_fbp2 = img_fbp2 - np.min(img_fbp2)
img_fbp2 = 255 * img_fbp2 / np.max(img_fbp2)
```

In []:

```
In [14]: fig6 = plt.figure(6, figsize=[10, 10])
ax_f61 = fig6.add_subplot(2, 1, 1)
# plot of image
ax_f61.imshow(sinogram_f2, cmap='Greys' )
ax_f61.set_ylabel('rows')
ax_f61.set_xlabel('columns')
ax_f61.set_title('sinogram after weighting in frequency domain by Ram-Lak filter');

ax_f62 = fig6.add_subplot(2, 1, 2)
# plot of image
ax_f62.imshow(img_fbp2[300:1200, 250:1750], cmap='Greys_r')
```

Out[14]: <matplotlib.image.AxesImage at 0x1d0dc4a7110>



```
In [15]: fname_sino = './sinograms/sinogram_lamp.npz'  
npzData = np.load(fname_sino)  
print(f"npzData.files: {npzData.files}")
```

```
npzData.files: ['N_theta', 'theta_vec_deg', 't_vec', 'sinogram']
```

```
In [16]: # get data and initialize filtered sinogram  
N_theta = npzData['N_theta']
```

```

theta_vec_deg = npzData['theta_vec_deg']
t_vec = npzData['t_vec']
sinogram = npzData['sinogram']
np.nan_to_num(sinogram, copy=False)

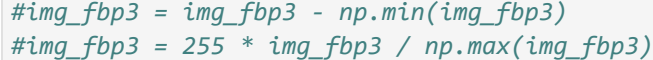
sinogram = sinogram - np.min(sinogram)

# H_ram_lak = np.abs(f_fft)
ds = (t_vec[-1]-t_vec[0])/len(t_vec) # sampling spacing
nrows, ncols = sinogram.shape
H_ram_lak = np.abs(np.fft.fftfreq(ncols, d=ds))

# bounding box of image
x_min = t_vec[0]
x_max = t_vec[-1]
y_min = x_min
y_max = x_max

# nr pixels of image
Nx = 1000
Ny = int(Nx * ncols / nrows)

img_fbp3, sinogram_f3 = backprojection2(sinogram, x_min, x_max, y_min, y_max, Nx, N



```

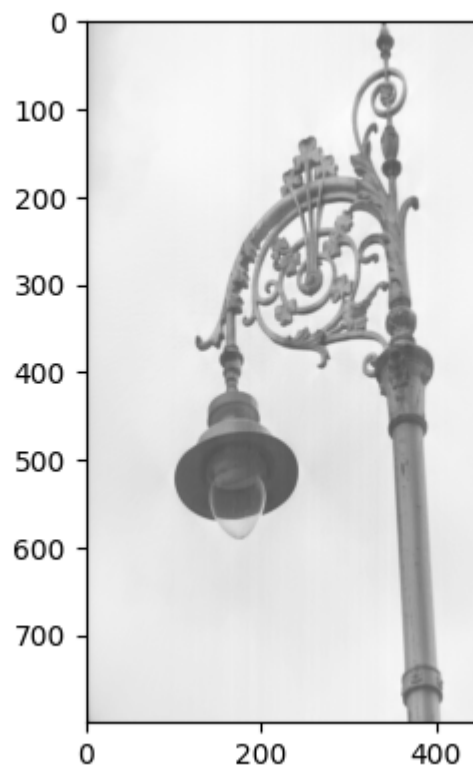
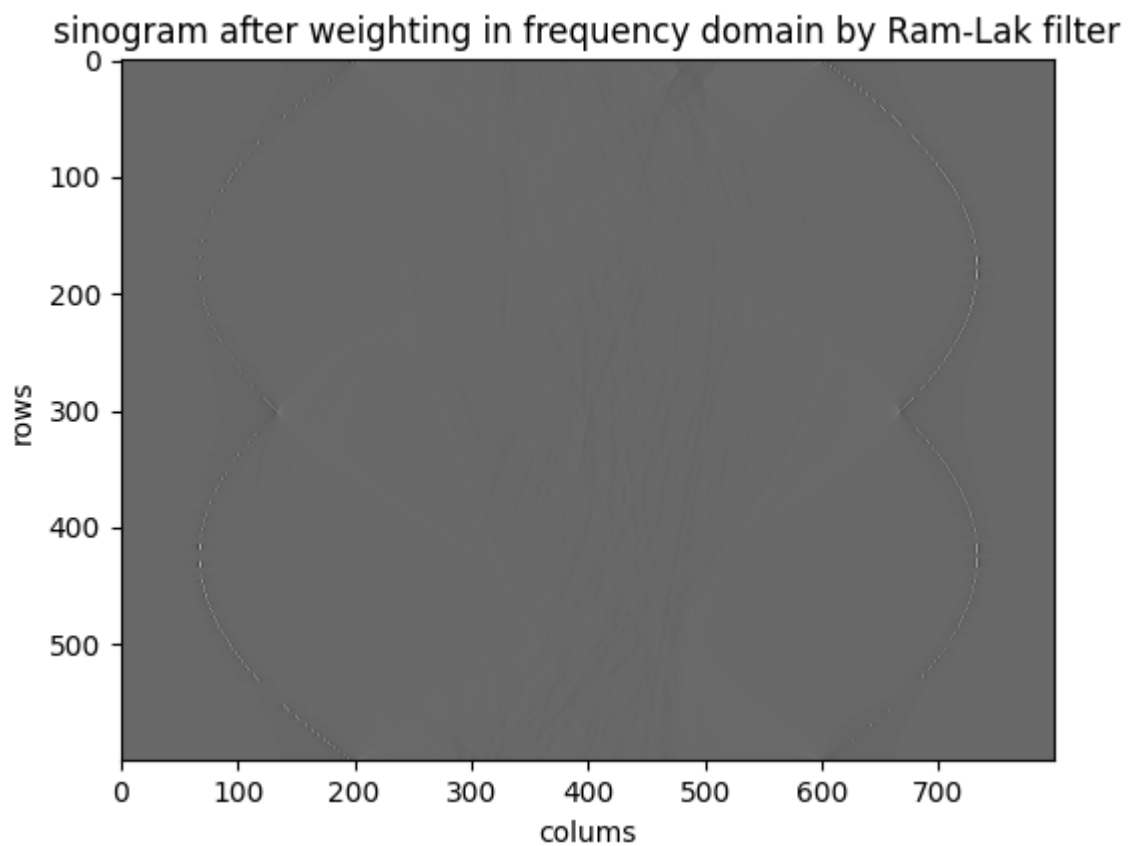
```

In [17]: fig7 = plt.figure(7, figsize=[10, 10])
ax_f71 = fig7.add_subplot(2, 1, 1)
# plot of image
ax_f71.imshow(sinogram_f3, cmap='Greys_r' )
ax_f71.set_ylabel('rows')
ax_f71.set_xlabel('columns')
ax_f71.set_title('sinogram after weighting in frequency domain by Ram-Lak filter');

ax_f72 = fig7.add_subplot(2, 1, 2)
# plot of image
ax_f72.imshow(img_fbp3[300:1100,250:700], cmap='Greys_r')

```

Out[17]: <matplotlib.image.AxesImage at 0x1d0e0dd9c50>



```
In [18]: np.min(img_fbp3[300:1100,250:700]), np.max(img_fbp3[300:1100,250:700])
```

```
Out[18]: (-6905857.651108878, 12215343.059351148)
```

```
In [ ]:
```

