

# XPCS3

November 2, 2015

## 1 XPCS Pipeline

“This notebook corresponds to version {{ version }} of the pipeline tool: <https://github.com/NSLS-II/pipelines>”

### 1.1 NSLS2 data retrieval imports

```
In [1]: from databroker import DataBroker as db, get_images, get_table, get_events
        from filestore.api import register_handler, deregister_handler
        from filestore.retrieve import _h_registry, _HANDLER_CACHE
```

```
In [2]: #hdr = db[{{ uid }}]
```

```
In [3]: import numpy as np
        import matplotlib as mpl
        import matplotlib.pyplot as plt
        from matplotlib.colors import LogNorm
```

#### 1.1.1 Lazy Eiger Handler (later will goto databroker)

```
In [4]: import h5py
        from filestore.retrieve import HandlerBase
        from eiger_io.pims_reader import EigerImages
```

```
EIGER_MD_DICT = {
    'y_pixel_size': 'entry/instrument/detector/y_pixel_size',
    'x_pixel_size': 'entry/instrument/detector/x_pixel_size',
    'detector_distance': 'entry/instrument/detector/detector_distance',
    'incident_wavelength': 'entry/instrument/beam/incident_wavelength',
    'frame_time': 'entry/instrument/detector/frame_time',
    'beam_center_x': 'entry/instrument/detector/beam_center_x',
    'beam_center_y': 'entry/instrument/detector/beam_center_y',
    'count_time': 'entry/instrument/detector/count_time',
    'pixel_mask': 'entry/instrument/detector/detectorSpecific/pixel_mask',
}
```

```
class FixedEigerImages(EigerImages):
    def __init__(self, path, metadata):
        super().__init__(path)
        self._metadata = metadata

    @property
    def md(self):
        return self._metadata
```

```

@property
def dtype(self):
    return self.pixel_type

@property
def shape(self):
    return self.frame_shape

class LazyEigerHandler(HandlerBase):
    specs = {'AD_EIGER'} | HandlerBase.specs
    def __init__(self, fpath, frame_per_point, mapping=None):
        # create pims handler
        self.vals_dict = EIGER_MD_DICT.copy()
        if mapping is not None:
            self.vals_dict.update(mapping)
        self._base_path = fpath
        self.fpp = frame_per_point

    def __call__(self, seq_id):
        import h5py
        master_path = '{}_{}_master.h5'.format(self._base_path, seq_id)
        md = {}
        print('hdf5 path = %s' % master_path)
        with h5py.File(master_path, 'r') as f:
            md = {k: f[v].value for k, v in self.vals_dict.items()}
            # the pixel mask from the eiger contains:
            # 1 -- gap
            # 2 -- dead
            # 4 -- under-responsive
            # 8 -- over-responsive
            # 16 -- noisy
            pixel_mask = md['pixel_mask']
            pixel_mask[pixel_mask>0] = 1
            pixel_mask[pixel_mask==0] = 2
            pixel_mask[pixel_mask==1] = 0
            pixel_mask[pixel_mask==2] = 1
            md['framerate'] = 1./md['frame_time']
            # TODO Return a multi-dimensional PIMS seq
            return FixedEigerImages(master_path, md)

deregister_handler('AD_EIGER')
_HANDLER_CACHE.clear()
register_handler('AD_EIGER', LazyEigerHandler)

```

```

In [5]: %%matplotlib notebook
        %matplotlib inline

```

### 1.1.2 Get the events from the uid

```

In [6]: def print_attrs(name, obj):
        print(name)
        for key, val in obj.attrs.items():
            print("    %s: %s" % (key, val))

```

```

#f = h5py.File('/XF11ID/data/2015/10/16/bcdd8b95-6adc-476b-9c65_25_master.h5', 'r')
#f.visititems(print_attrs)

In [7]: uid = '8a3f3e04'

In [8]: hdr = db[uid]

In [9]: ev, = get_events(hdr, ['eiger_4M_cam_img_image_lightfield'], fill = True)

hdf5 path = /XF11ID/data/2015/10/30/ad0ec08c-201e-4723-a8a6-9093_master.h5

In [10]: imgs = ev['data']['eiger_4M_cam_img_image_lightfield']
          print (imgs)
          Nimg=len(imgs)

<Frames>
Length: 2500 frames
Frame Shape: 2167 x 2070
Pixel Datatype: uint16

In [11]: imgs.md

Out[11]: {'beam_center_x': 840.0,
          'beam_center_y': 336.0,
          'count_time': 0.0049999999,
          'detector_distance': 4.8400002,
          'frame_time': 0.00501,
          'framerate': 199.60079982206346,
          'incident_wavelength': 1.3794414,
          'pixel_mask': array([[1, 1, 1, ..., 1, 1, 0],
                                [1, 1, 1, ..., 1, 1, 1],
                                [1, 1, 1, ..., 1, 1, 1],
                                ...,
                                [1, 1, 1, ..., 1, 1, 1],
                                [1, 1, 1, ..., 1, 1, 1],
                                [1, 1, 1, ..., 1, 1, 1]]),
          'x_pixel_size': 7.5000004e-05,
          'y_pixel_size': 7.5000004e-05}

```

## 2 get masks

```

In [12]: class RemoveHotSpots(object):
          def __init__(self, indexable, threshold= 1E7 ):
              self.indexable = indexable
              self.threshold = threshold
              self.N = len( indexable )
          def _get_mask(self ):
              mask = np.ones_like( np.array( self.indexable[0]) )
              for key in range(self.N):
                  data = np.array( self.indexable[key]) #.copy()
                  badp = np.where( data >= self.threshold )
                  if len(badp[0])!=0:
                      mask[badp] = 0
              return mask

```

```
In [13]: class Masker(object):
        def __init__(self, indexable, mask):
            self.indexable = indexable
            self.mask = mask
        def __getitem__(self, key):
            return self.indexable[key] * mask
```

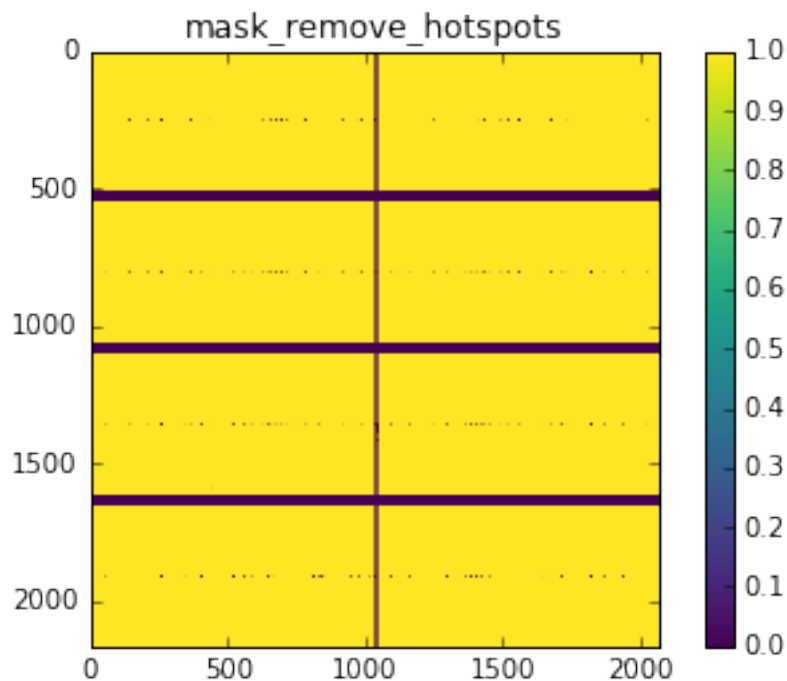
### 3 remove hotspots

```
In [14]: mask_rh = RemoveHotSpots( imgs, 5E4)._get_mask()
```

```
In [15]: #!/matplotliblib notebook
```

```
In [16]: fig, ax = plt.subplots()
        im = ax.imshow(mask_rh , vmin=0,vmax=1,cmap='viridis')
        ax.set_title( 'mask_remove_hotspots')
        plt.colorbar( im )
```

```
Out[16]: <matplotlib.colorbar.Colorbar at 0x7fe593d24668>
```

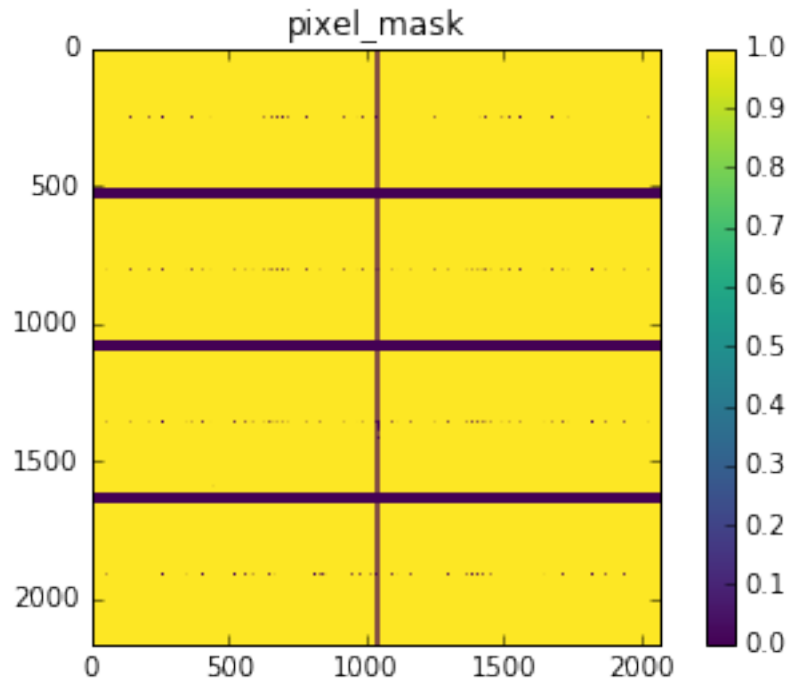


#### 3.0.3 show pixel mask from data

```
In [17]: #!/matplotliblib inline
```

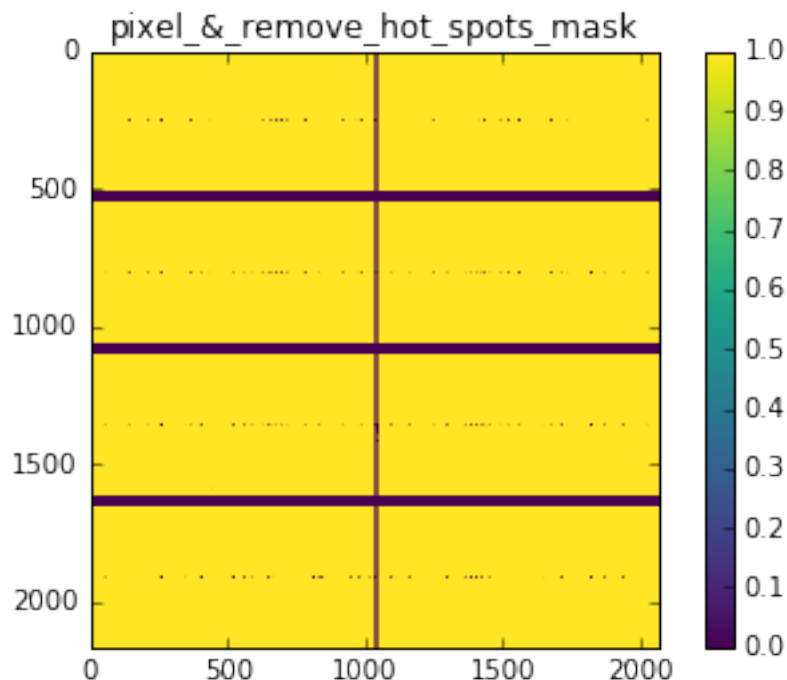
```
fig, ax = plt.subplots()
im = ax.imshow(imgs.md['pixel_mask'], vmin=0,vmax=1,cmap='viridis')
ax.set_title( 'pixel_mask')
plt.colorbar( im )
```

Out[17]: <matplotlib.colorbar.Colorbar at 0x7fe593c20780>



```
In [18]: imgs_mask = mask_rh * imgs.md['pixel_mask']
fig, ax = plt.subplots()
im = ax.imshow(imgs_mask, vmin=0, vmax=1, cmap='viridis')
ax.set_title( 'pixel_&_remove_hot_spots_mask' )
plt.colorbar( im )
```

Out[18]: <matplotlib.colorbar.Colorbar at 0x7fe593b5c0b8>



### 3.1 Interactive way to browse through images.

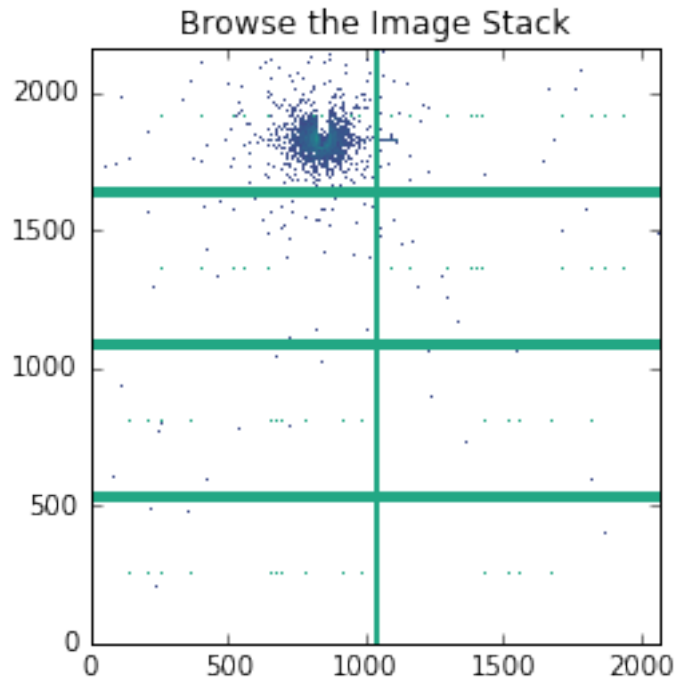
#### 3.1.1 Note : Provide the number of images that you want to browse

```
In [19]: ##matplotlib inline
## there is a bug for %matplotlib notebook
from ipywidgets import interact

def view_image(i):
    fig, ax = plt.subplots()
    ax.imshow(imgs[i], interpolation='nearest', cmap='viridis',
              origin='lower', norm= LogNorm( vmin=0.001, vmax=1e10 ) )
    ax.set_title("Browse the Image Stack")
    #plt.show()

    interact(view_image, i=(0, Nimg-1))

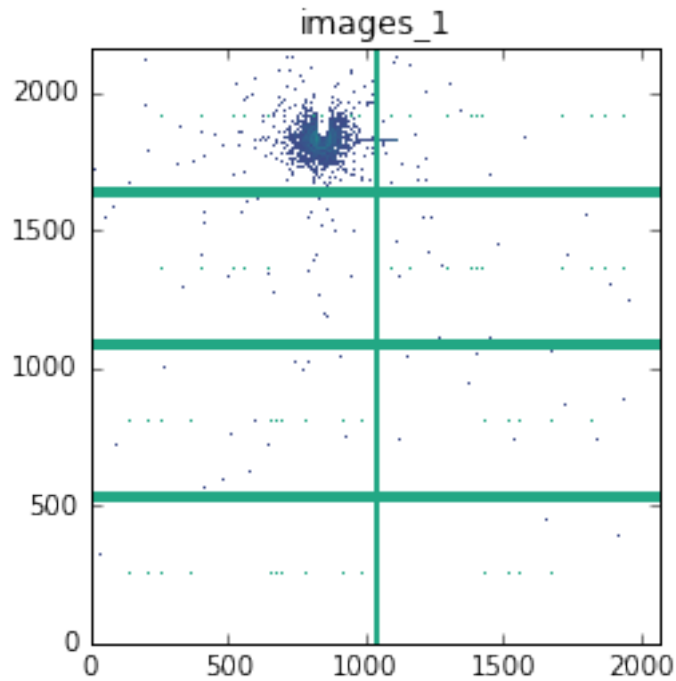
Out[19]: <function __main__.view_image>
```



## 4 a movie of images

```
In [20]: import time
def view_image(sleeps=1, ims=0, ime = 1):
    fig, ax = plt.subplots()
    for i in range( ims, ime ):
        ax.imshow(imgs[i], interpolation='nearest', cmap='viridis',
                  origin='lower', norm= LogNorm( vmin=0.001, vmax=1e10 ) )
        ax.set_title("images_%s"%i)
        time.sleep( sleeps )
    plt.draw()

view_image( .2, 0, 2)
```



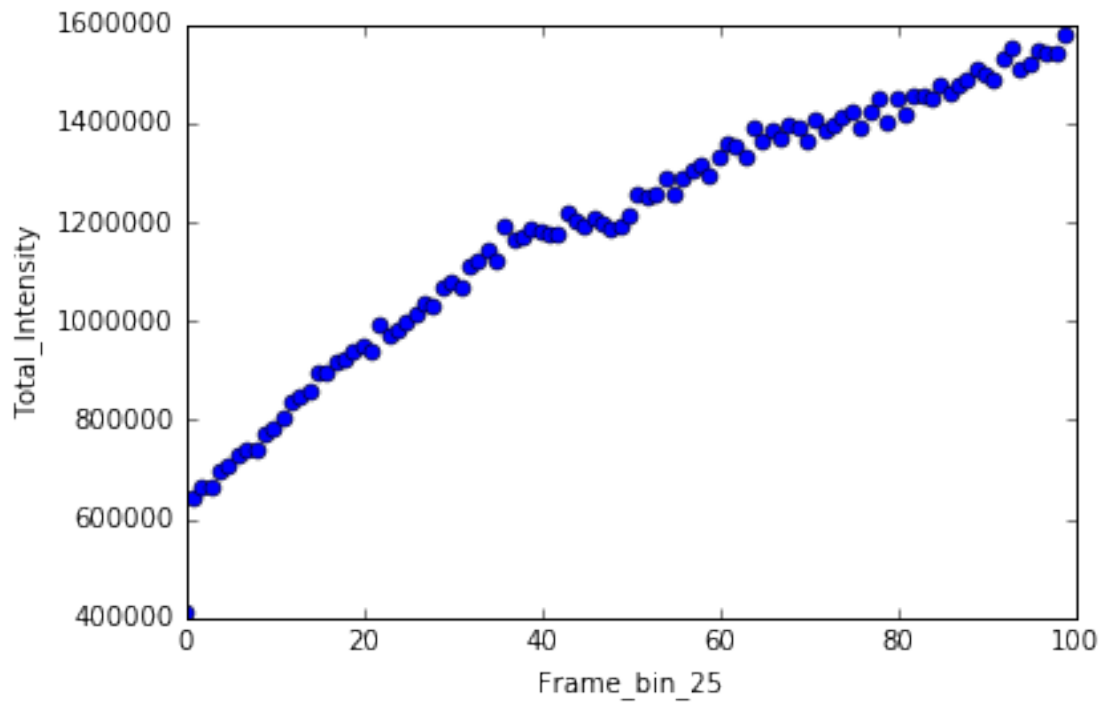
#### 4.0.2 Get the Averaged Image Data

```
In [21]: #hey, let's see if any images are bad!
        bin_img =25
        imgsum = [np.sum(img *imgs_mask) for img in imgs[:,bin_img :]]

In [22]: #!/matplotliblib inline
        fig, ax = plt.subplots()
        ax.plot(imgsum,'bo')
        ax.set_xlabel( 'Frame_bin_%s'%bin_img )
        ax.set_ylabel( 'Total_Intensity' )

Out[22]: <matplotlib.text.Text at 0x7fe593b04160>
```

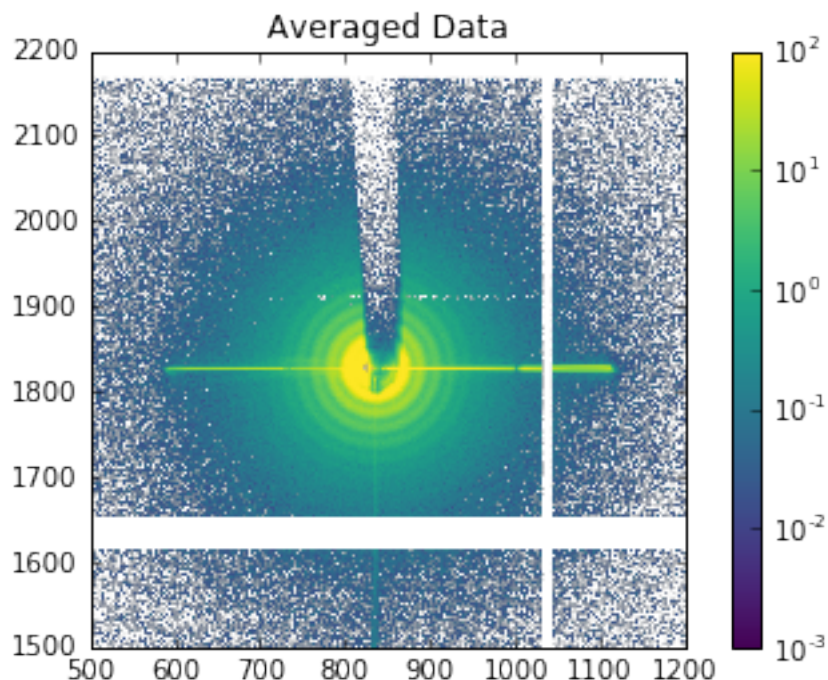




```
In [23]: avg_img = np.average(imgs[:50], axis=0) * imgs_mask
```

```
In [24]: # Plot the result
```

```
fig, ax = plt.subplots()
im = ax.imshow(avg_img, cmap='viridis', origin='lower', norm= LogNorm( vmin=0.001, vmax=1e2 ) )
ax.set_xlim([500,1200])
ax.set_ylim([1500,2200])
fig.colorbar(im)
ax.set_title("Averaged Data")
plt.show()
```



#### 4.1 Import all the required packages for Data Analysis

- scikit-xray - data analysis tools for X-ray science
  - <https://github.com/scikit-xray/scikit-xray>
- xray-vision - plotting helper functions for X-ray science
  - <https://github.com/Nikea/xray-vision>

```
In [25]: import xray_vision
import xray_vision.mpl_plotting as mpl_plot
from xray_vision.mpl_plotting import speckle
from xray_vision.mask.manual_mask import ManualMask

import skxray.core.roi as roi

import skxray.core.correlation as corr
import skxray.core.utils as utils
```

```
/home/yuzhang/.conda/envs/user_analysis/lib/python3.4/site-packages/IPython/html.py:14: ShimWarning: The
"IPython.html.widgets" has moved to "ipywidgets"., ShimWarning)
```

#### 4.2 Note: Enter the following experiment information

- The physical size of the pixels
- Wavelength of the X-rays - (units in Angstroms)
- Detector to sample distance
- Exposure time - (units in seconds)
- acquisition period - (units in seconds)

- dead time - (units in seconds)
- time per frame = (exposure time + dead.time or acquisition period) - (units in seconds)

In [26]: `imgs.md`

```
Out[26]: {'beam_center_x': 840.0,
          'beam_center_y': 336.0,
          'count_time': 0.0049999999,
          'detector_distance': 4.8400002,
          'frame_time': 0.00501,
          'framerate': 199.60079982206346,
          'incident_wavelength': 1.3794414,
          'pixel_mask': array([[1, 1, 1, ..., 1, 1, 0],
                               [1, 1, 1, ..., 1, 1, 1],
                               [1, 1, 1, ..., 1, 1, 1],
                               ...,
                               [1, 1, 1, ..., 1, 1, 1],
                               [1, 1, 1, ..., 1, 1, 1],
                               [1, 1, 1, ..., 1, 1, 1]]), dtype=uint32),
          'x_pixel_size': 7.5000004e-05,
          'y_pixel_size': 7.5000004e-05}
```

```
In [27]: # The physical size of the pixels
dpix = imgs.md['x_pixel_size'] * 1000.
lambda_ = imgs.md['incident_wavelength']      # wavelegth of the X-rays in Angstroms
Ldet = 5000.                                # detector to sample distance (mm)

exposuretime= imgs.md['count_time']
acquisition_period = imgs.md['frame_time']

# deadtime= 0      # 60e-6
# timeperframe = exposuretime + deadtime
timeperframe = acquisition_period
```

```
In [28]: print (timeperframe)
         print (exposuretime)
```

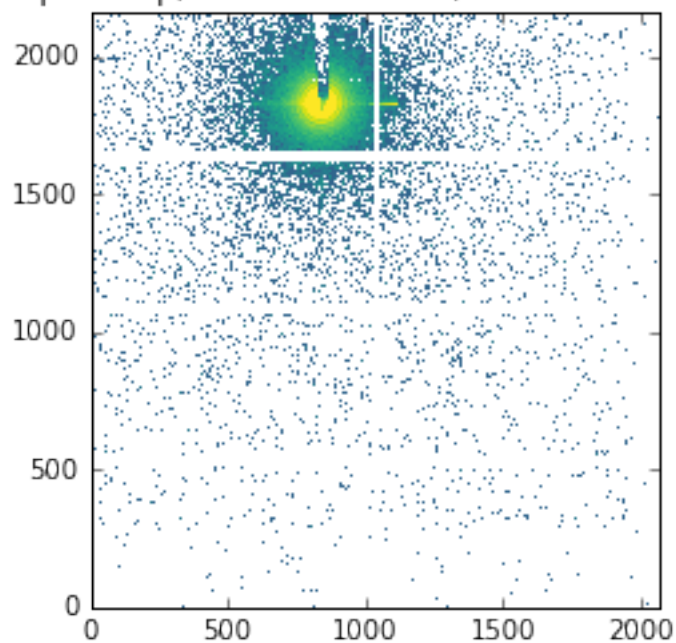
```
0.00501
0.005
```

### 4.3 Create the mask file

More information : [https://github.com/Nikea/xray-vision/blob/master/xray\\_vision/mask/manual\\_mask.py](https://github.com/Nikea/xray-vision/blob/master/xray_vision/mask/manual_mask.py)

```
In [29]: fig, ax = plt.subplots()
         m = ManualMask(ax, avg_img, cmap='viridis',origin='lower', norm= LogNorm( vmin=0.001, vmax=1e
```

'i': lasso, 't': pixel flip, alt inverts lasso, 'r': reset mask, 'q': no tools

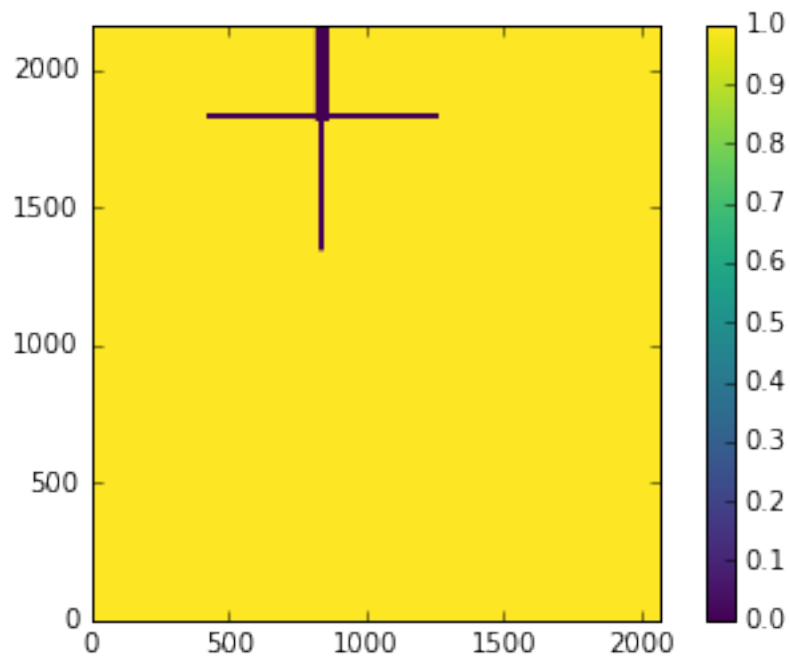


#### 4.3.1 load a mask if exist

```
In [30]: new_mask = np.load( '/XF11ID/analysis/Analysis_Pipelines/mask_Si.npy')
```

```
In [31]: #new_mask = m.mask
fig, ax = plt.subplots()
im=ax.imshow(1-new_mask,origin='lower' ,vmin=0,vmax=1,cmap='viridis')
plt.colorbar( im )
```

```
Out[31]: <matplotlib.colorbar.Colorbar at 0x7fe5886ce048>
```

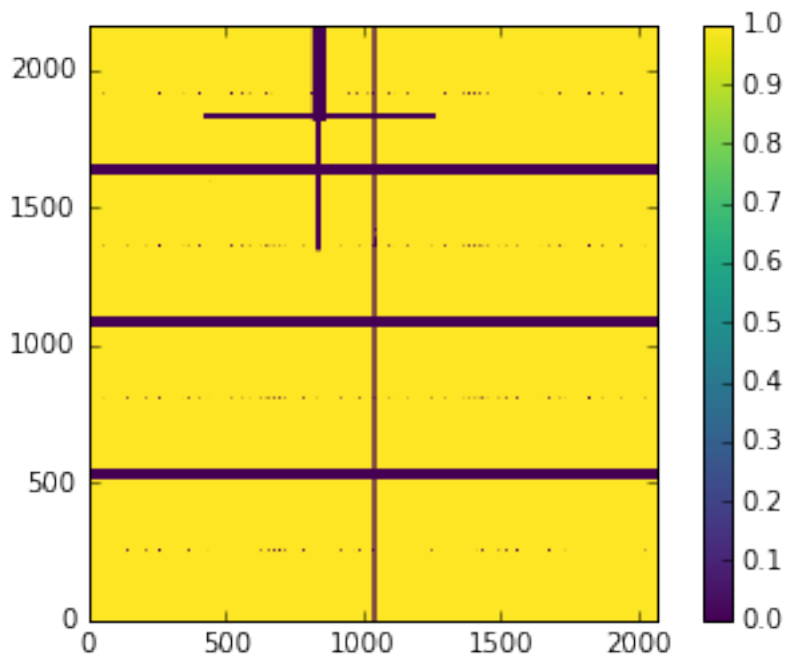


#### 4.3.2 Combine the hand-drawn mask and the pixel mask

```
In [32]: mask = (1-new_mask) * imgs_mask
```

```
In [33]: fig, ax = plt.subplots()
         im=ax.imshow(mask,origin='lower',vmin=0,vmax=1,cmap='viridis')
         fig.colorbar( im )
```

```
Out[33]: <matplotlib.colorbar.Colorbar at 0x7fe5817ab160>
```



```
In [34]: img_mask = avg_img * mask
```

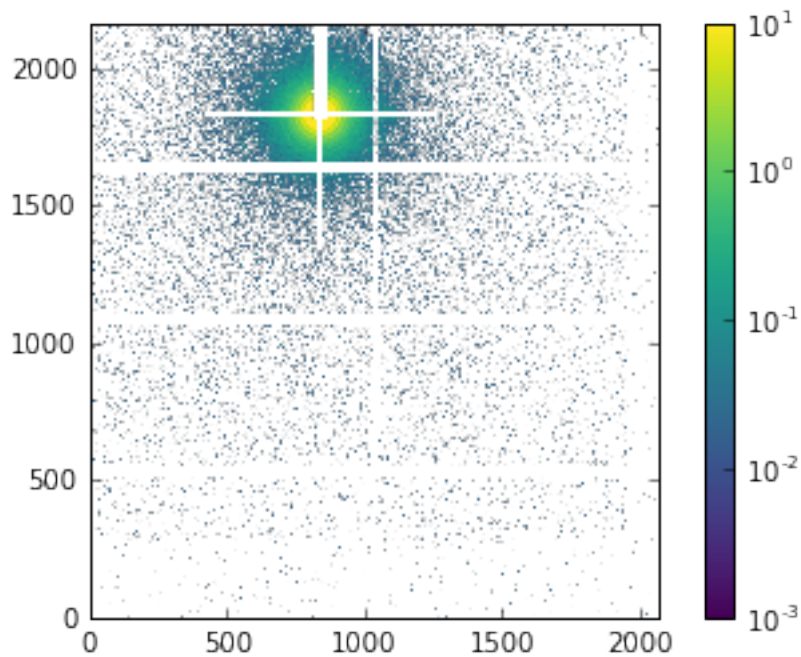
```
##matplotlib notebook
```

```
fig, ax = plt.subplots()
```

```
im = ax.imshow(img_mask, cmap='viridis',origin='lower', norm= LogNorm( vmin=0.001, vmax=1e1 ) )
```

```
fig.colorbar( im )
```

```
Out[34]: <matplotlib.colorbar.Colorbar at 0x7fe5816f0898>
```



## 4.4 Get the approximate center and see the statistic to make sure

```
In [35]: #center = (1634.66, 838.6) # center of the speckle pattern
        #center = (imgs.md['beam_center_x'], imgs.md['beam_center_y'])
        center = [840, 1830]
```

```
center
```

```
Out[35]: [840, 1830]
```

```
In [36]: center=[center[1],center[0]]
        #center=[center[0],center[1]]
```

```
In [37]: imgs.md['beam_center_x'], imgs.md['beam_center_y']
```

```
Out[37]: (840.0, 336.0)
```

### 4.4.1 Circular Average : compute the radial integration from the center of the speckle pattern

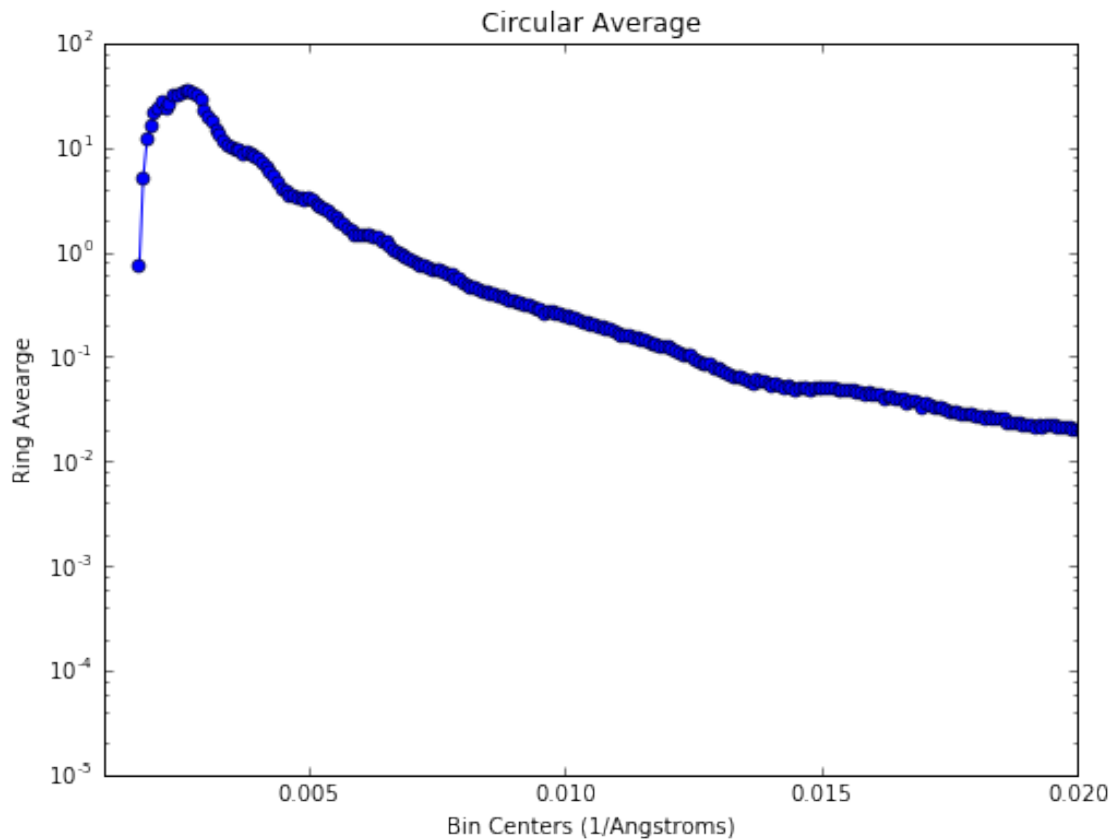
```
In [38]: bin_centers, ring_averages= roi.circular_average(img_mask,
        center, threshold=0, nx=2000, pixel_size=(dpix, dpix))
```

```
# convert to q (reciprocal space)
two_theta = utils.radius_to_twtheta(Ldet, bin_centers)
q_val = utils.twtheta_to_q(two_theta, lambda_)
```

```
In [39]: fig,axes = plt.subplots(figsize=(8, 6))
        axes.semilogy(q_val, ring_averages, '-o')
```

```
#axes.plot(q_val, ring_averages, '-o')
axes.set_title("Circular Average")
axes.set_ylabel("Ring Avearge")
axes.set_xlabel("Bin Centers (1/Angstroms)")
axes.set_xlim(0.001, 0.02)
```

```
plt.show()
```



#### 4.5 Create label array (Q rings)

#### 4.6 can we change the function of `roi.ring_edges` to give same values as `make_qlist`?

```
In [40]: inner_radius = 44 # radius of the first ring
         width = 2 # width of each ring
         spacing = (119-44)/9-2 # no spacing between rings
         num_rings = 10 # number of rings

         # find the edges of the required rings
         edges = roi.ring_edges(inner_radius, width, spacing, num_rings)
         edges
```

```
Out[40]: array([[ 44.         ,  46.         ],
                [ 52.33333333,  54.33333333],
                [ 60.66666667,  62.66666667],
                [ 69.         ,  71.         ],
                [ 77.33333333,  79.33333333],
                [ 85.66666667,  87.66666667],
                [ 94.         ,  96.         ],
                [102.33333333, 104.33333333],
                [110.66666667, 112.66666667],
                [119.         , 121.         ]])
```



```

In [41]: two_theta = utils.radius_to_twtheta(Ldet, edges*dpix)
         q_ring_val = utils.twtheta_to_q(two_theta, lambda_)

         q_ring_val

Out[41]: array([[ 0.00300622,  0.00314286],
                [ 0.00357558,  0.00371222],
                [ 0.00414494,  0.00428158],
                [ 0.0047143 ,  0.00485094],
                [ 0.00528365,  0.0054203 ],
                [ 0.00585301,  0.00598966],
                [ 0.00642237,  0.00655902],
                [ 0.00699173,  0.00712838],
                [ 0.00756109,  0.00769773],
                [ 0.00813045,  0.00826709]])

In [42]: q_ring_center = np.array( [(q_ring_val[i][0] + q_ring_val[i][1])/2 for
                                     i in range(num_rings)])

         q_ring_center

Out[42]: array([ 0.00307454,  0.0036439 ,  0.00421326,  0.00478262,  0.00535198,
                0.00592134,  0.00649069,  0.00706005,  0.00762941,  0.00819877])

In [43]: rings = roi.rings(edges, center, avg_img.shape)

         ring_mask = rings*mask

In [44]: (q_ring_center/6.841437171805092e-05)[9]

Out[44]: 119.839854621893

```

## 4.7 Extract the labeled array

```

In [45]: ring_mask

Out[45]: array([[ 0.,  0.,  0., ...,  0.,  0.,  0.],
                [ 0.,  0.,  0., ...,  0.,  0.,  0.],
                [ 0.,  0.,  0., ...,  0.,  0.,  0.],
                ...,
                [ 0.,  0.,  0., ...,  0.,  0.,  0.],
                [ 0.,  0.,  0., ...,  0.,  0.,  0.],
                [ 0.,  0.,  0., ...,  0.,  0.,  0.]])

In [46]: labels, indices = roi.extract_label_indices(ring_mask)

In [47]: labels

Out[47]: array([ 10.,  10.,  10., ...,  10.,  10.,  10.])

In [48]: indices

Out[48]: array([3540544, 3540545, 3540546, ..., 4033224, 4033225, 4033226])

In [49]: nopr = np.bincount( np.array(labels, dtype=int) )[1:]
         nopr

Out[49]: array([ 328,  450,  576,  649,  788,  871,  971, 1089, 1186, 1290])

```

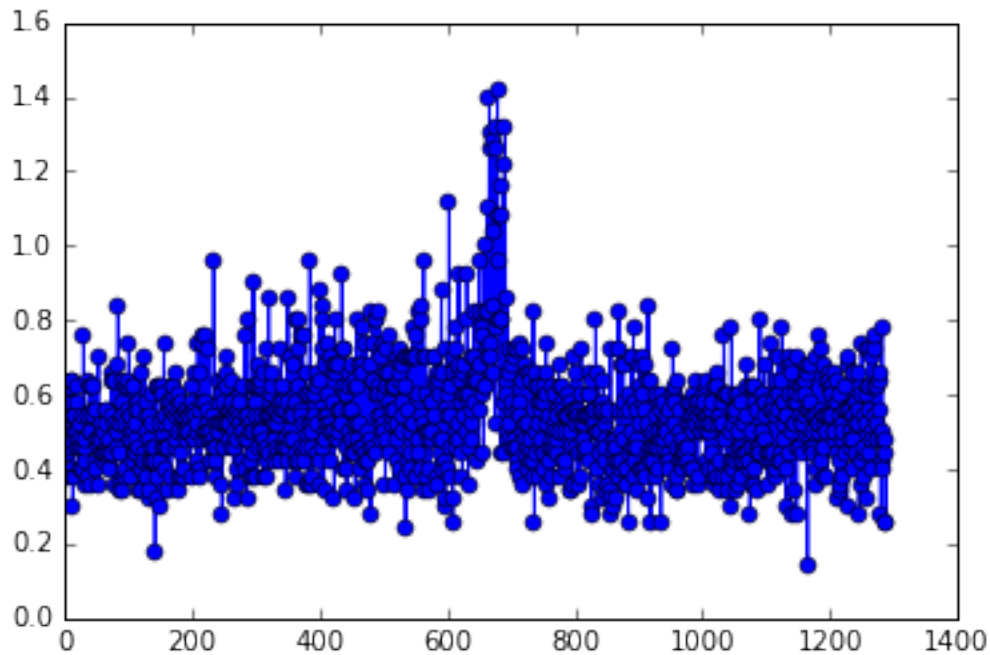
## 5 check center

### 5.1 this function should be changed,

#### 5.1.1 should check center before given ring\_mask

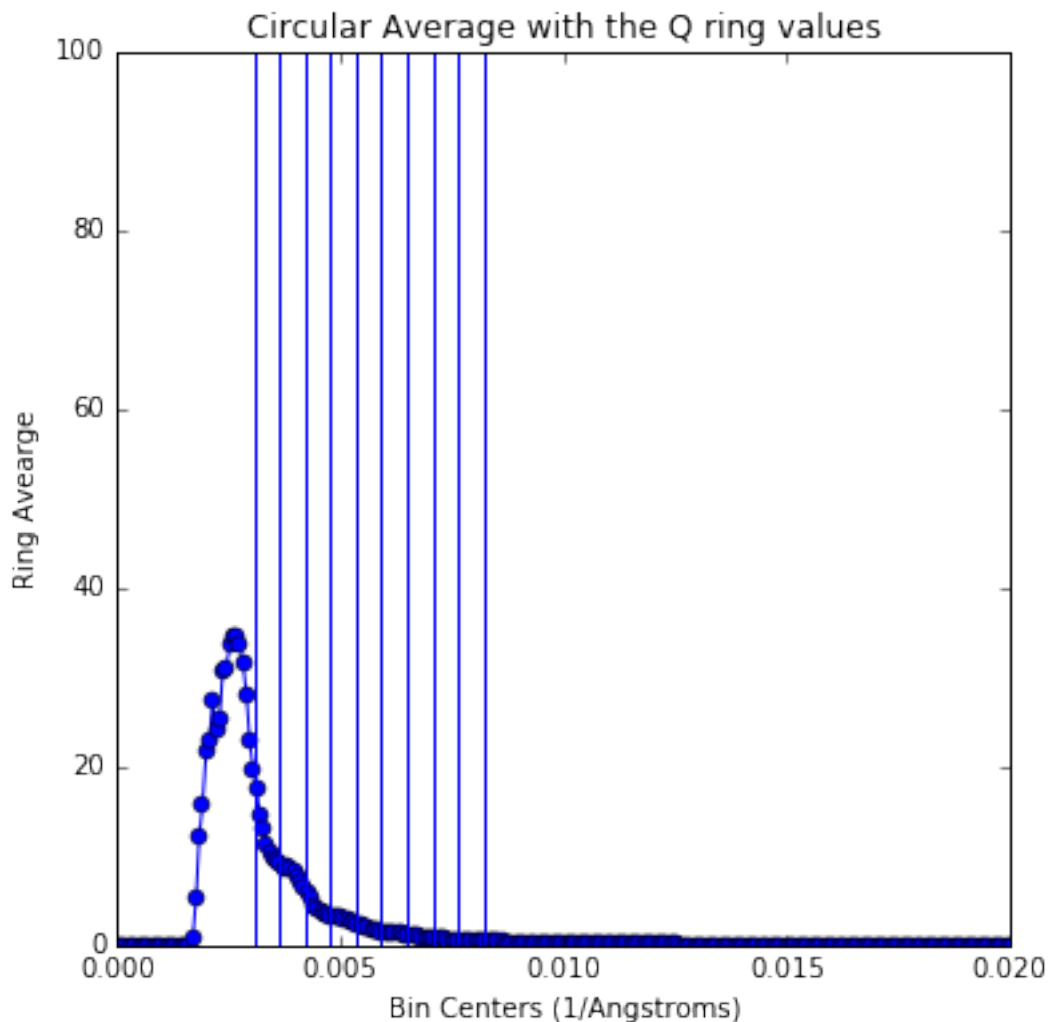
```
In [50]: pixel = roi.roi_pixel_values( avg_img*mask, ring_mask, [10] )
fig,ax=plt.subplots()
ax.plot( pixel[0][0] , 'bo', ls='-' )
```

```
Out[50]: [matplotlib.lines.Line2D at 0x7fe581588898]
```



```
In [51]: fig, axes = plt.subplots( figsize=(6, 6))
        #axes.semilogy(q_val, ring_averages, '-o')

        axes.plot(q_val, ring_averages, '-o')
        axes.set_title("Circular Average with the Q ring values")
        axes.set_ylabel("Ring Average")
        axes.set_xlabel("Bin Centers (1/Angstroms)")
        axes.set_xlim(0, 0.02)
        axes.set_ylim(0, 100)
        for i in range(num_rings):
            #axes.axvline(q_ring_val[i], 0)
            axes.axvline(q_ring_center[i])
        plt.show()
```

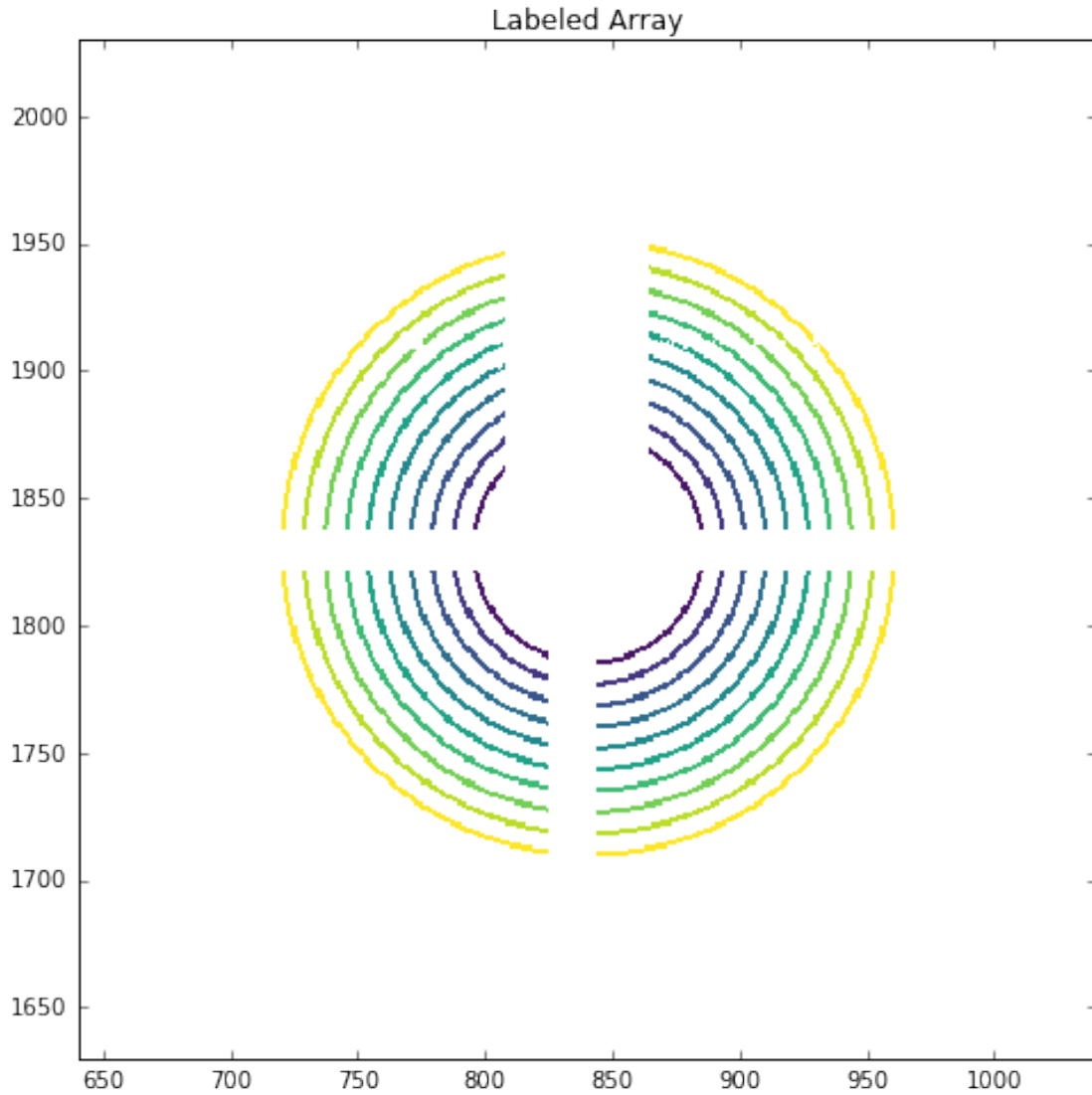


```
In [52]: ## matplotlib notebook
         # plot the figure
         fig, axes = plt.subplots(figsize=(8,8))
         axes.set_title("Labeled Array")
         im = mpl_plot.show_label_array(axes, ring_mask, cmap='viridis',origin='lower')

         rwidth = 200

         x1,x2 = [center[1] - rwidth, center[1] + rwidth]
         y1,y2 = [center[0] - rwidth, center[0] + rwidth]
         axes.set_xlim( [x1,x2])
         axes.set_ylim( [y1,y2])
```

```
Out[52]: (1630, 2030)
```

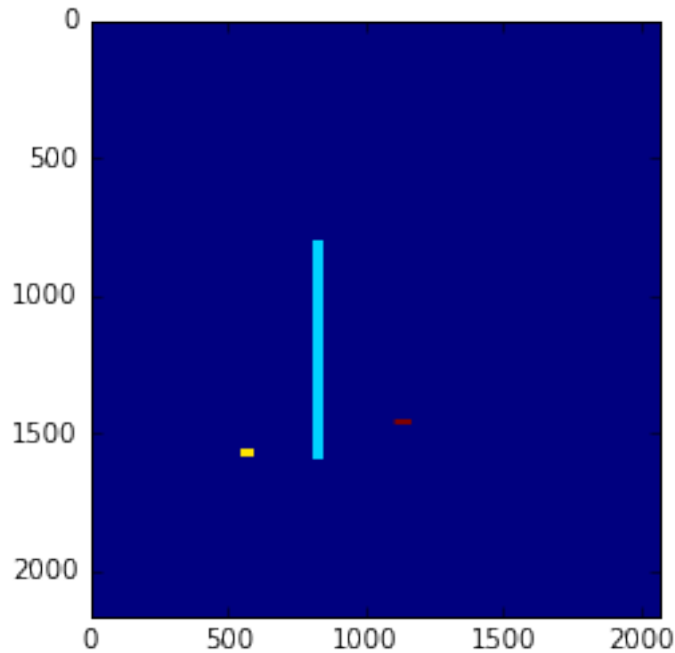


## 5.2 Plot Kymograph (Waterfall plot) for a vertical and horizontal cuts

Note : Give coordinates of the upper-left corner and width and height of each rectangle: e.g., [(x, y, w, h), (x, y, w, h)]

In [53]: `vert_rect = ((800, 803, 800, 40), (1554, 546, 30, 40), (1454, 1098, 20, 60))`

```
V_K_label_array = roi.rectangles(vert_rect, avg_img.shape)
plt.figure()
plt.imshow(V_K_label_array)
plt.show()
```



```
In [54]: center
```

```
Out[54]: [1830, 840]
```

```
In [55]: V_K_label_array
```

```
Out[55]: array([[0, 0, 0, ..., 0, 0, 0],
                [0, 0, 0, ..., 0, 0, 0],
                [0, 0, 0, ..., 0, 0, 0],
                ...,
                [0, 0, 0, ..., 0, 0, 0],
                [0, 0, 0, ..., 0, 0, 0],
                [0, 0, 0, ..., 0, 0, 0]])
```

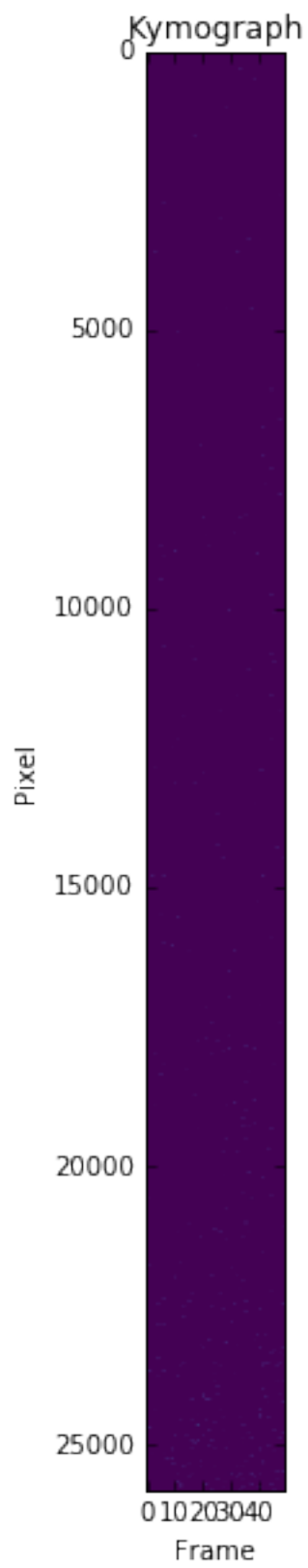
### 5.3 Kymograph(waterfall plot) of the 3rd ring

```
In [56]: masker = Masker(imgs, mask)
```

```
In [57]: veri_kymo = roi.kymograph(masker[:, :50], V_K_label_array*mask, num = 1)
```

```
In [58]: fig, ax = plt.subplots(figsize=(14,10))
        ax.set_ylabel('Pixel')
        ax.set_xlabel('Frame')
        ax.set_title('Kymograph')

        im = ax.imshow(veri_kymo.T, cmap='viridis', vmax=10)
        #fig.colorbar(im)
        ax.set_aspect(0.02)
        plt.show()
```



```
In [59]: mask_data = masker[:,50] #this one is too slow if make masker[:,1]  
        mean_int_sets, index_list = roi.mean_intensity(mask_data, ring_mask)
```

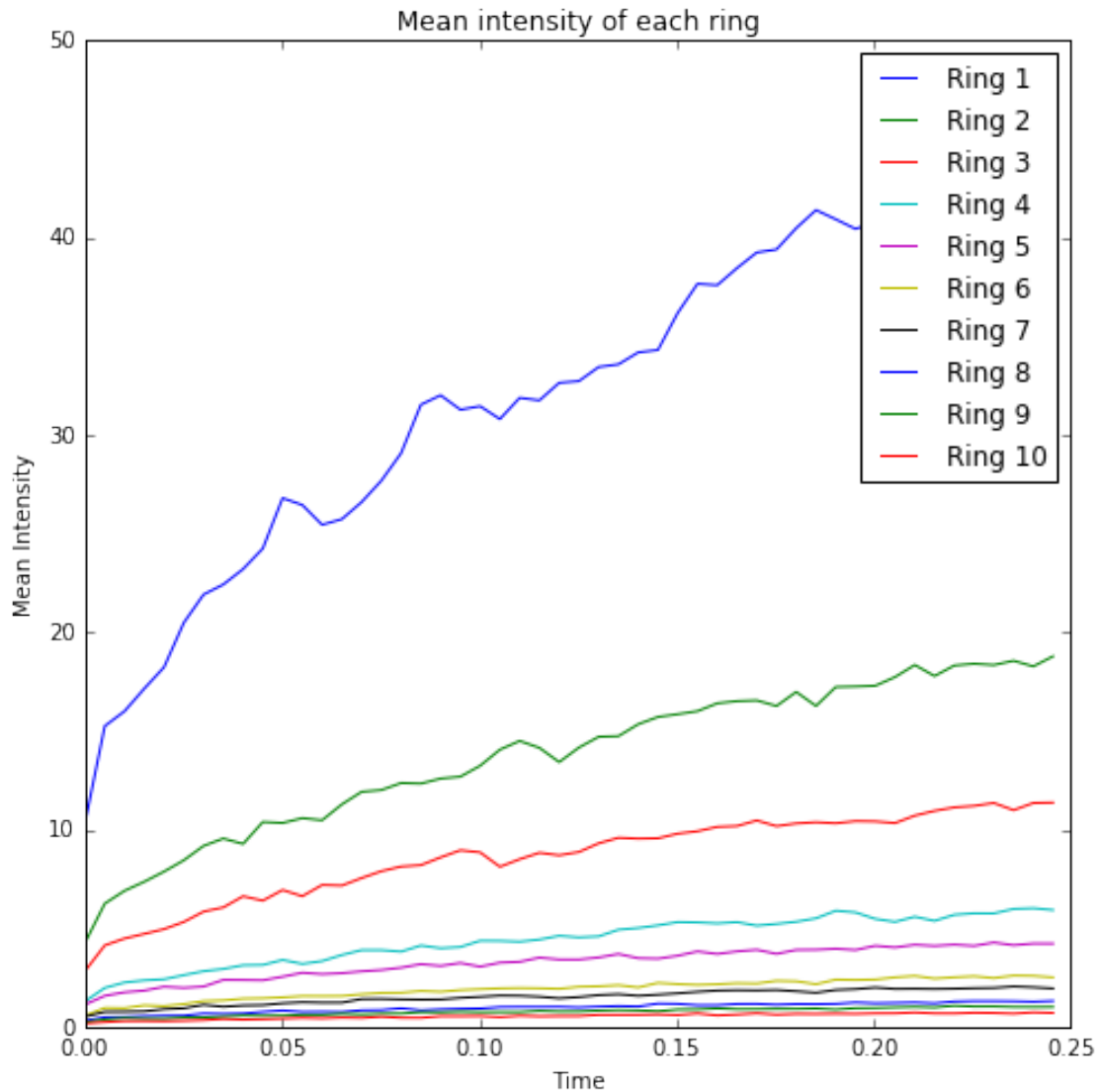
## 5.4 Mean intensities for each ring

```
In [60]: mean_int_sets.shape
```

```
Out[60]: (50, 10)
```

```
In [61]: time = np.arange(len(mask_data))*timeperframe # get the time for each frame
```

```
%matplotlib inline  
fig, ax = plt.subplots(figsize=(8, 8))  
ax.set_title("Mean intensity of each ring")  
for i in range(num_rings):  
    ax.plot(time, mean_int_sets[:,i], label="Ring "+str(i+1))  
    ax.set_xlabel("Time")  
    ax.set_ylabel("Mean Intensity")  
ax.legend()  
plt.show()
```



In [ ]:

## 5.5 One time Correlation

Note : Enter the number of levels and number of buffers for Muliti tau one time correlation number of buffers has to be even. More details in <https://github.com/scikit-xray/scikit-xray/blob/master/skxray/core/correlation.py>

```
In [62]: ring_mask = np.array( ring_mask, dtype=int)
```

```
In [63]: num_lev = 9
         num_buf = 8
```

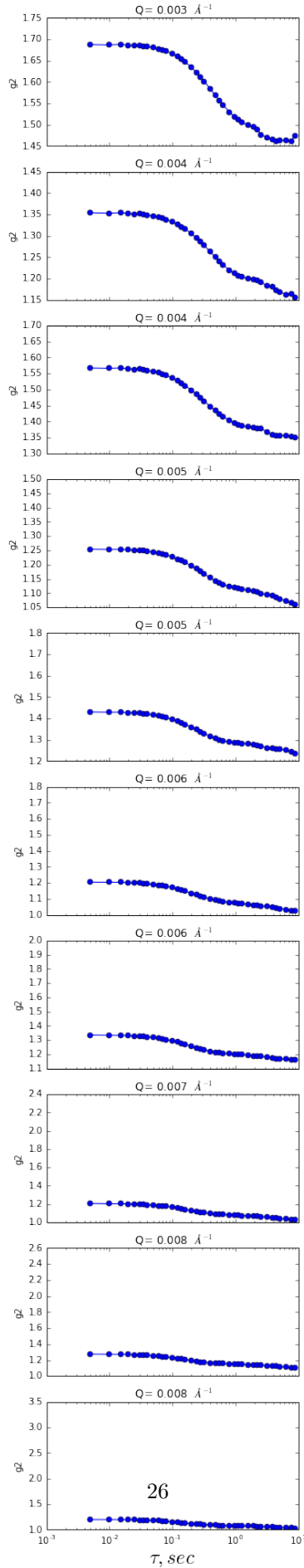
```
g2, lag_steps = corr.multi_tau_auto_corr(num_lev, num_buf, ring_mask, imgs)
```



### 5.5.1 Plot the one time correlation functions

```
In [64]: lags = lag_steps*timeperframe

fig, axes = plt.subplots(num_rings, sharex=True, figsize=(5, 30))
axes[num_rings-1].set_xlabel(r"$\tau, sec$", fontsize=22)
for i in range(num_rings):
    axes[i].set_ylabel("g2")
    axes[i].set_title(" Q= " + '%.3f' %(q_ring_center[i]) + r'$\AA^{-1}$')
    axes[i].semilogx(lags, g2[:, i], '-o', markersize=6)
    #axes[i].set_ylim(bottom=1.10, top=1.15)
plt.show()
```



## 6 Fit g2

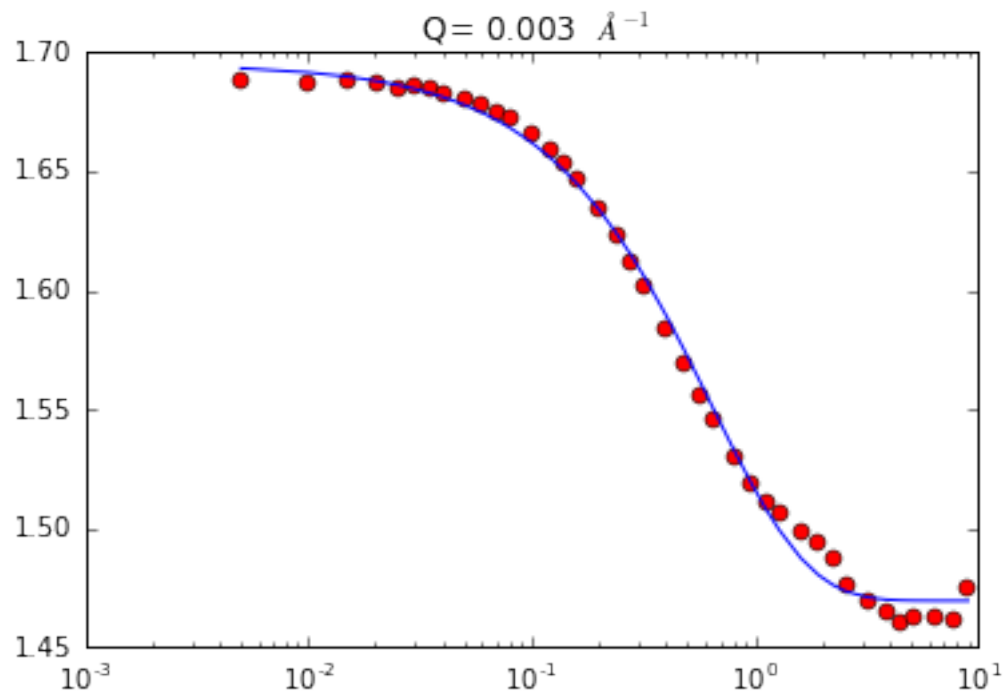
```
In [65]: from lmfit import Model
         mod = Model(corr.auto_corr_scatter_factor)

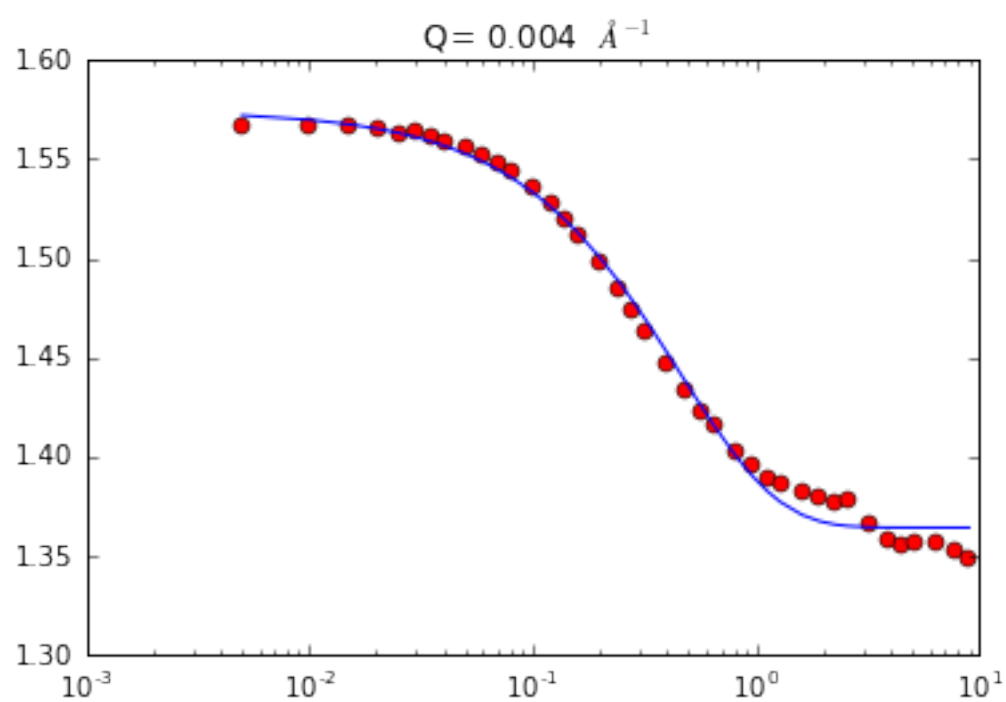
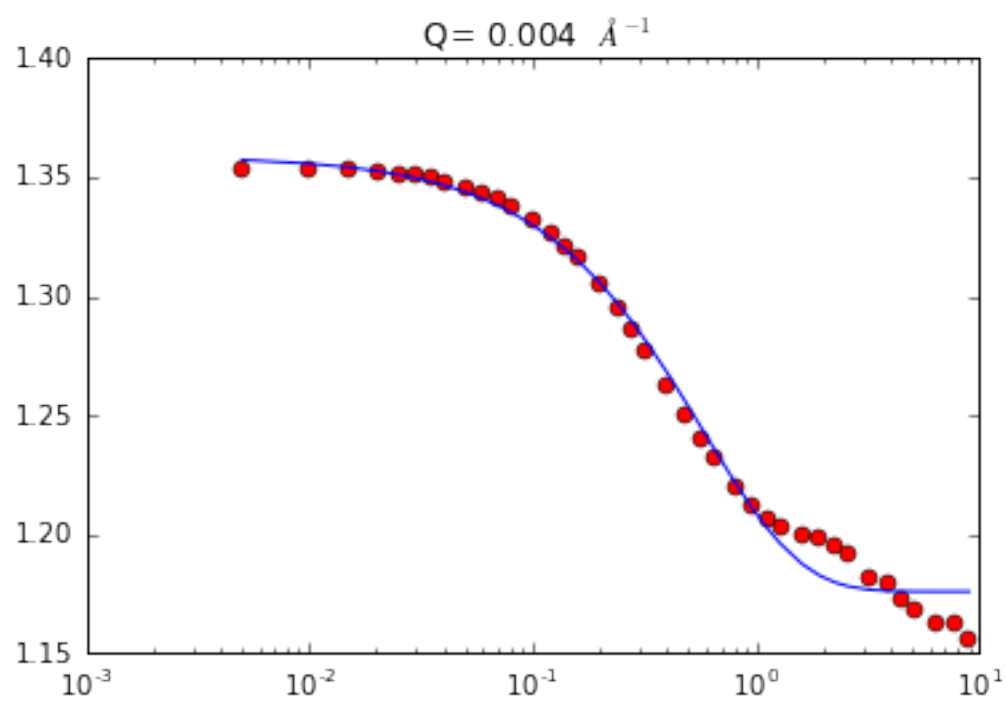
In [66]: %matplotlib inline
         rate = []
         for i in range(num_rings):

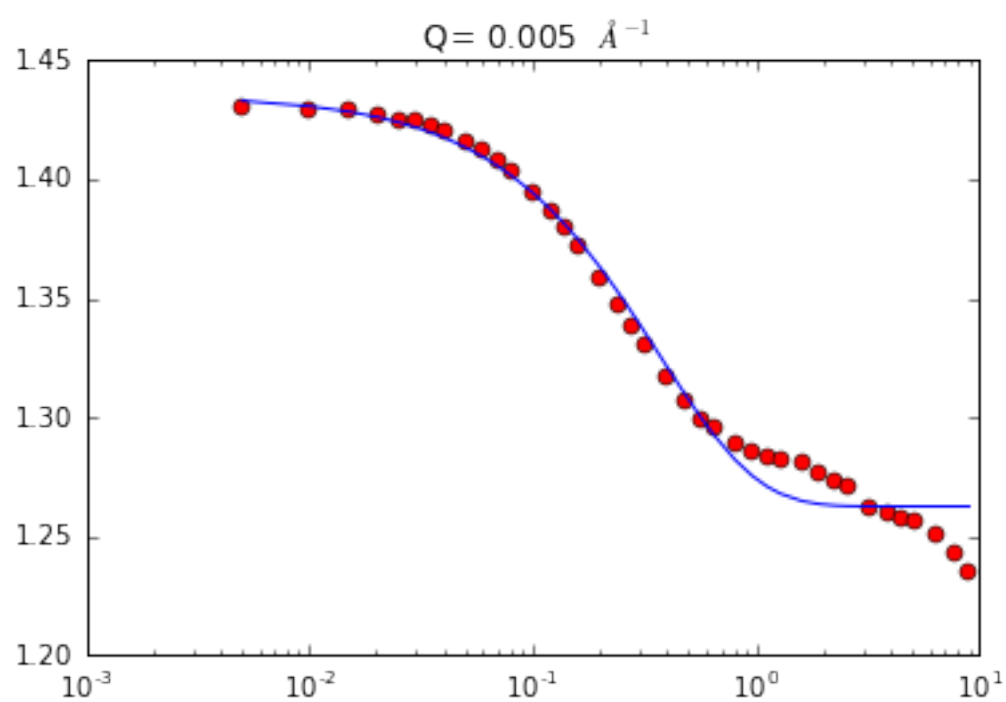
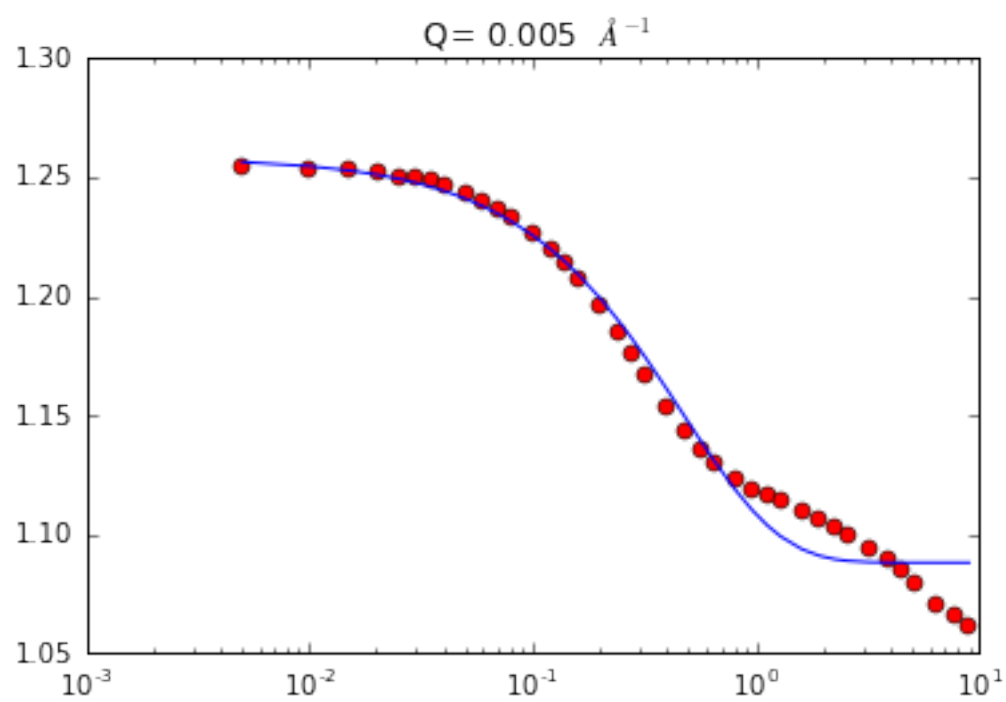
             result1 = mod.fit(g2[1:,i], lags=lags[1:], beta=.1, relaxation_rate =.5, baseline=1.0)

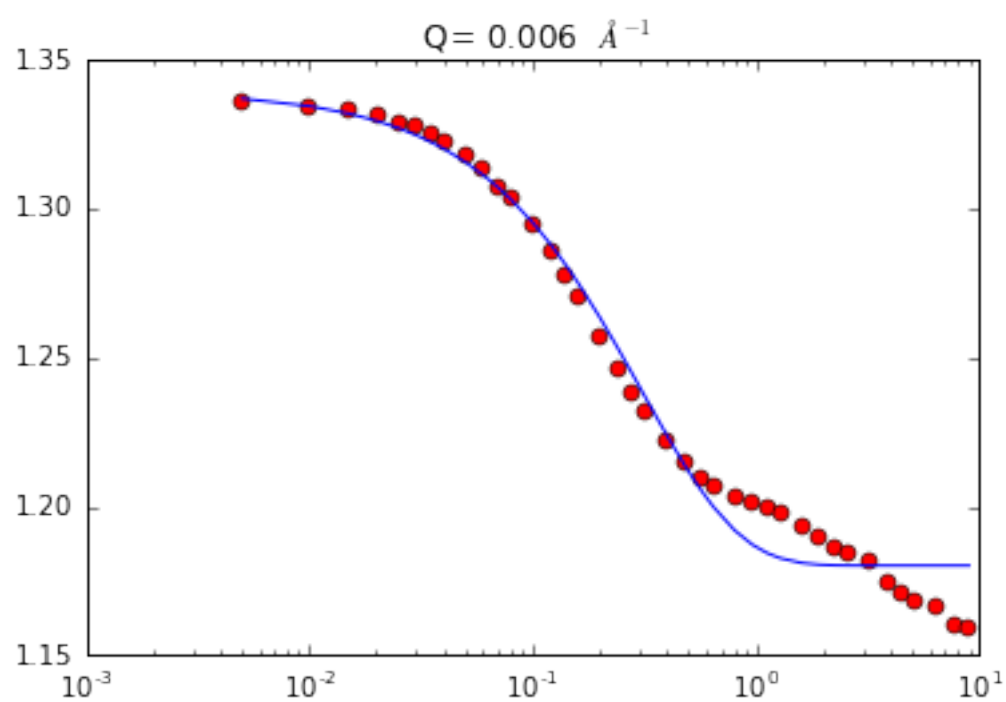
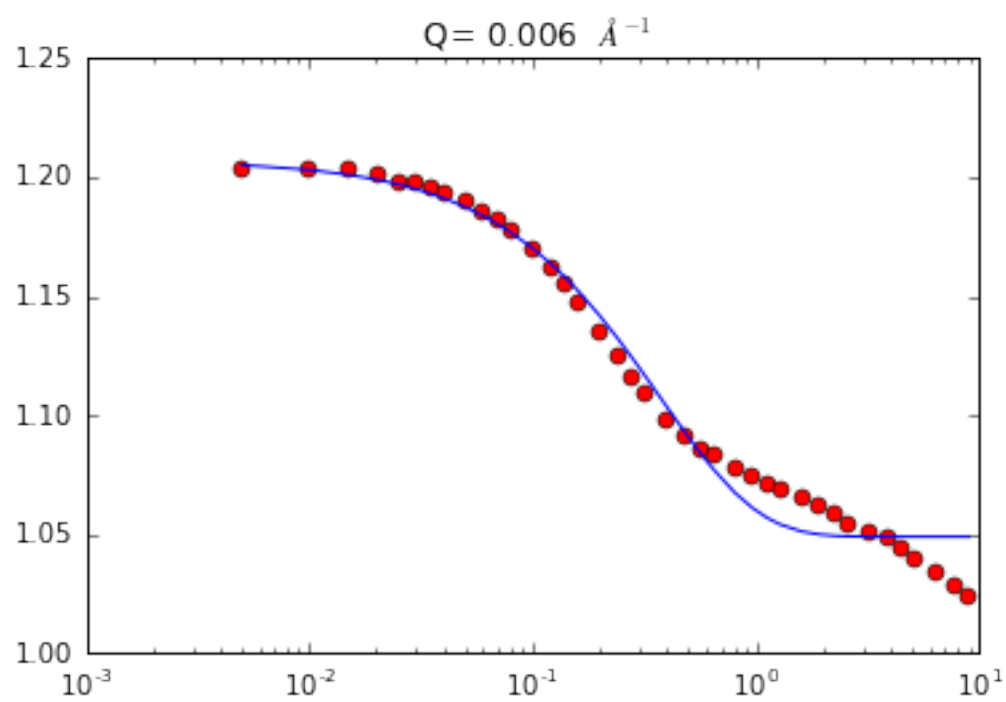
             rate.append(result1.best_values['relaxation_rate'])
             plt.figure()
             plt.semilogx(lags[1:], g2[1:, i], 'ro')
             plt.semilogx(lags[1:], result1.best_fit, '-b')
             #plt.ylim(1., 1.3)
             #axes[i].set_title(" Q= " + '%.3f' %(q_ring_center[i]) + r'\AA^{-1}\ell')

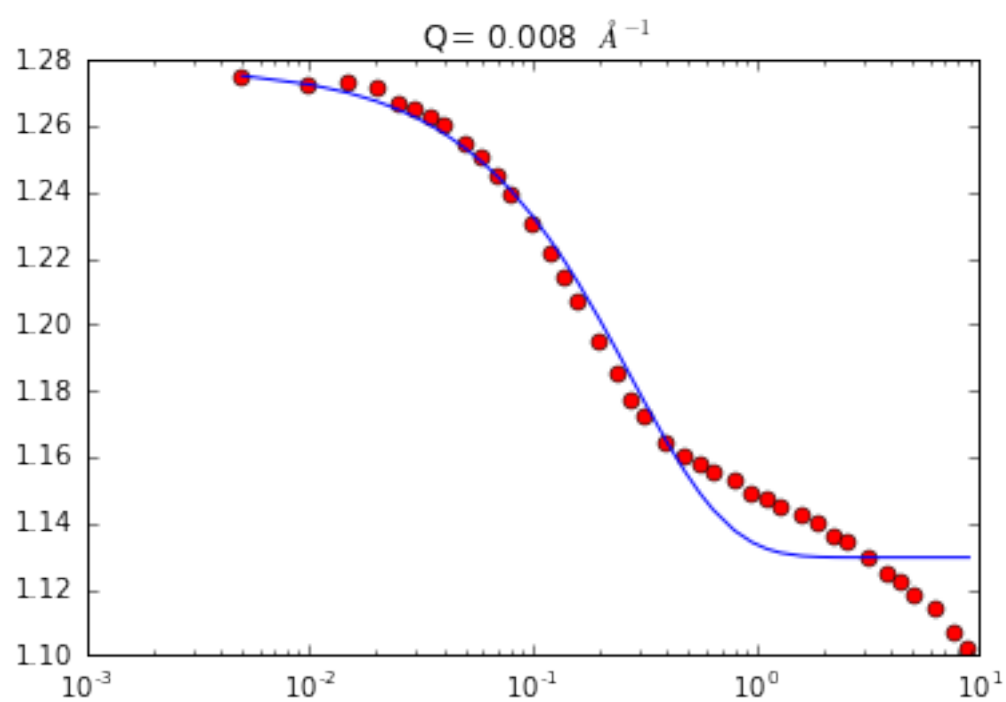
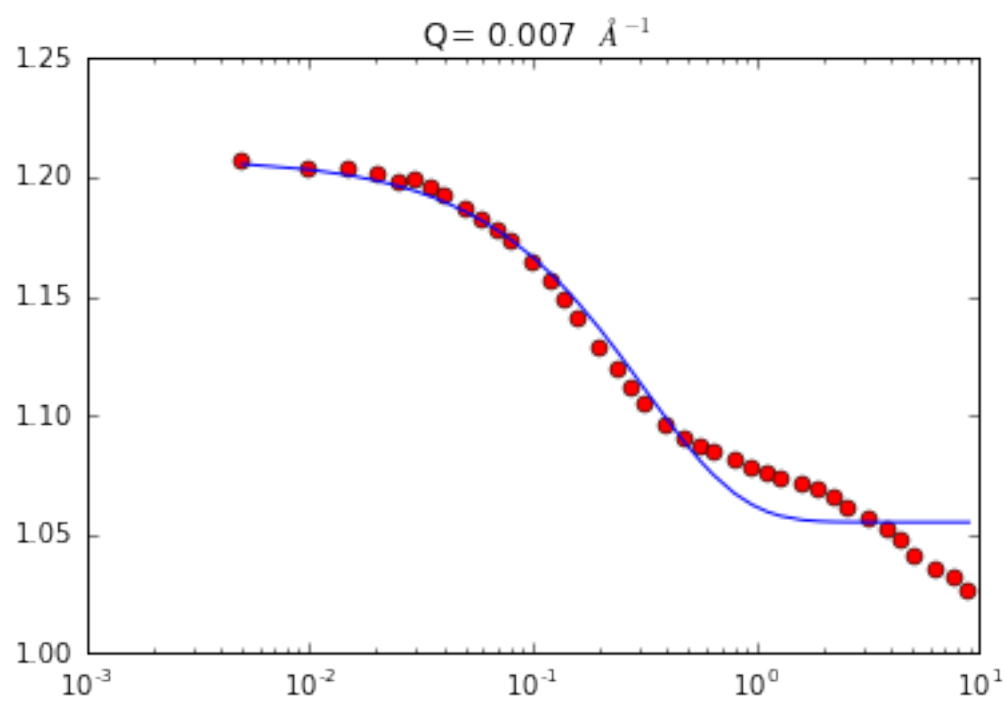
             plt.title(" Q= " + '%.3f' %(q_ring_center[i]) + r'\AA^{-1}\ell')
         plt.show()
```

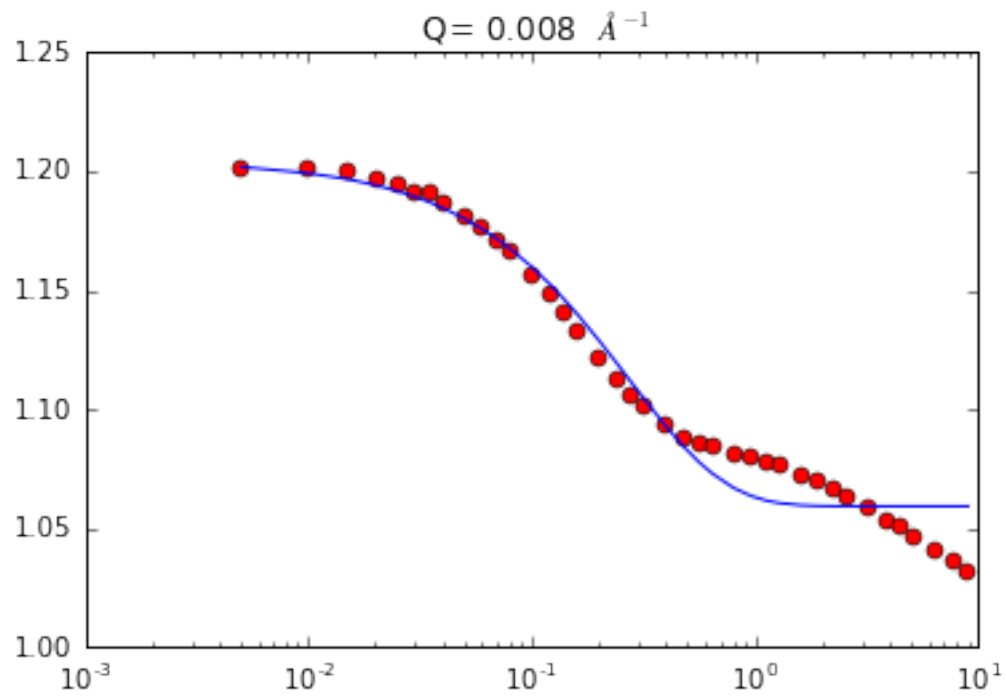












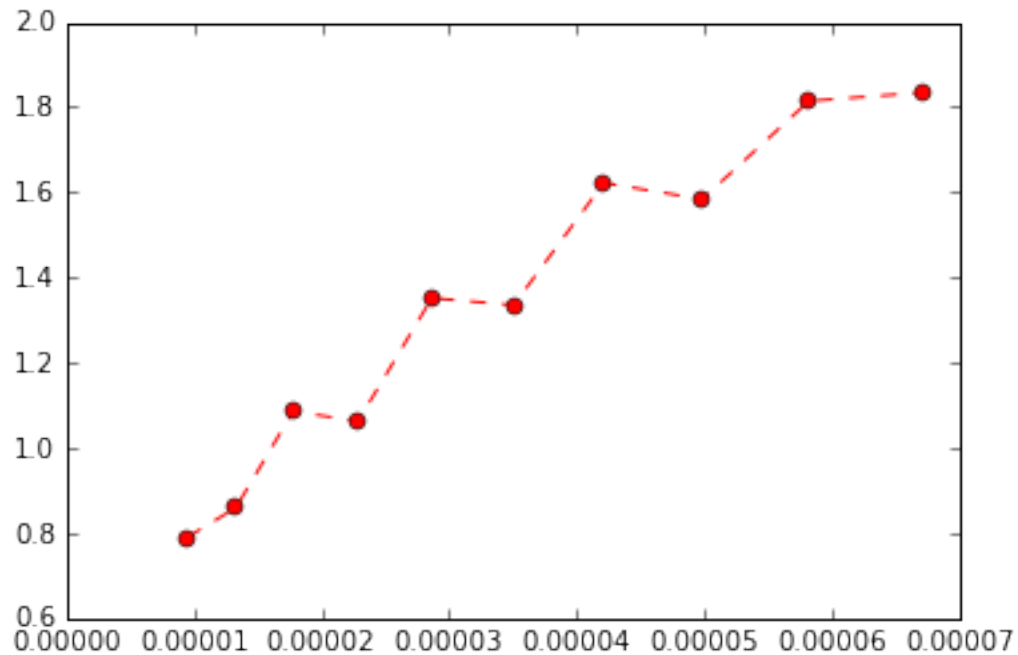
```
In [67]: result1.best_values
```

```
Out[67]: {'baseline': 1.0594209410128113,
          'beta': 0.14492830189481173,
          'relaxation_rate': 1.8344361090851411}
```

```
In [68]: fig,ax=plt.subplots()
          ax.plot( q_ring_center**2, rate, 'ro', ls='--')
```

```
Out[68]: [<matplotlib.lines.Line2D at 0x7fe580428470>]
```



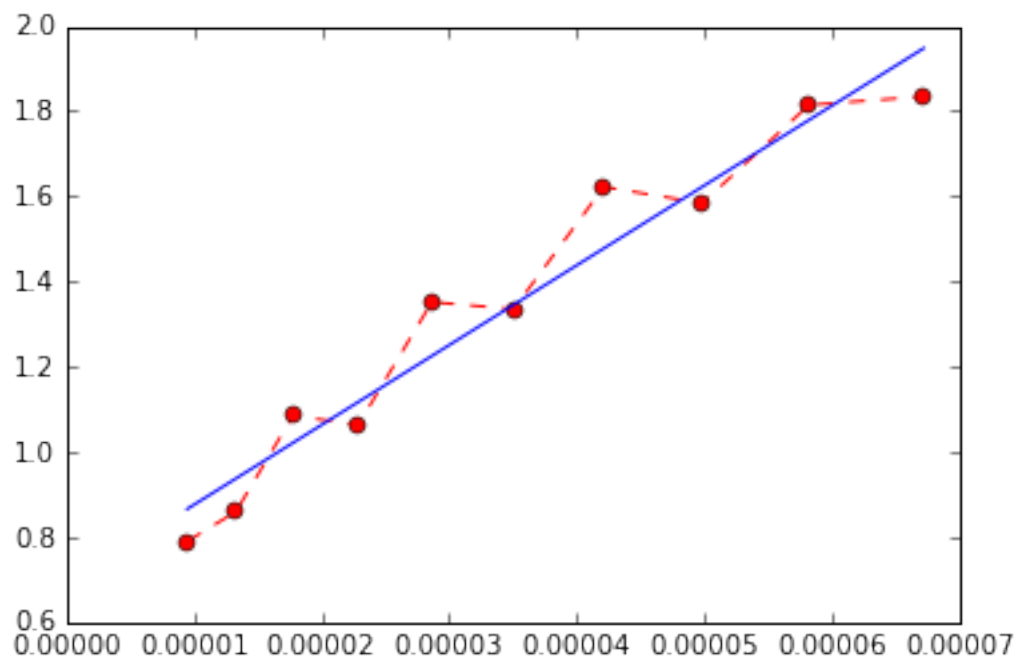


```
In [71]: D0 = np.polyfit(q_ring_center**2, rate, 1)
          gmfit = np.poly1d(D0)
          print ('The fitted diffusion coefficient D0 is: %.2E A^2S-1'%D0[0])
```

The fitted diffusion coefficient D0 is: 1.87E+04 A^2S-1

```
In [72]: fig,ax=plt.subplots()
          ax.plot( q_ring_center**2, rate, 'ro', ls='--')
          ax.plot( q_ring_center**2, gmfit( q_ring_center**2), ls='--')
```

```
Out[72]: [<matplotlib.lines.Line2D at 0x7fe58021f128>]
```



In [ ]: