

```
In [387... import numpy as np
```

```
import skimage
```

```
import skimage.io
```

```
import matplotlib.pyplot as plt
```

```
In [388... image = skimage.io.imread('https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif')
```

```
In [389... image
```

```
Out[389]: array([[219, 225, 220, ..., 256, 258, 272],  
[218, 211, 217, ..., 270, 268, 278],  
[217, 217, 214, ..., 263, 268, 262],  
...,  
[337, 343, 321, ..., 266, 287, 285],  
[320, 323, 339, ..., 268, 295, 281],  
[329, 353, 335, ..., 276, 281, 291]], dtype=uint16)
```

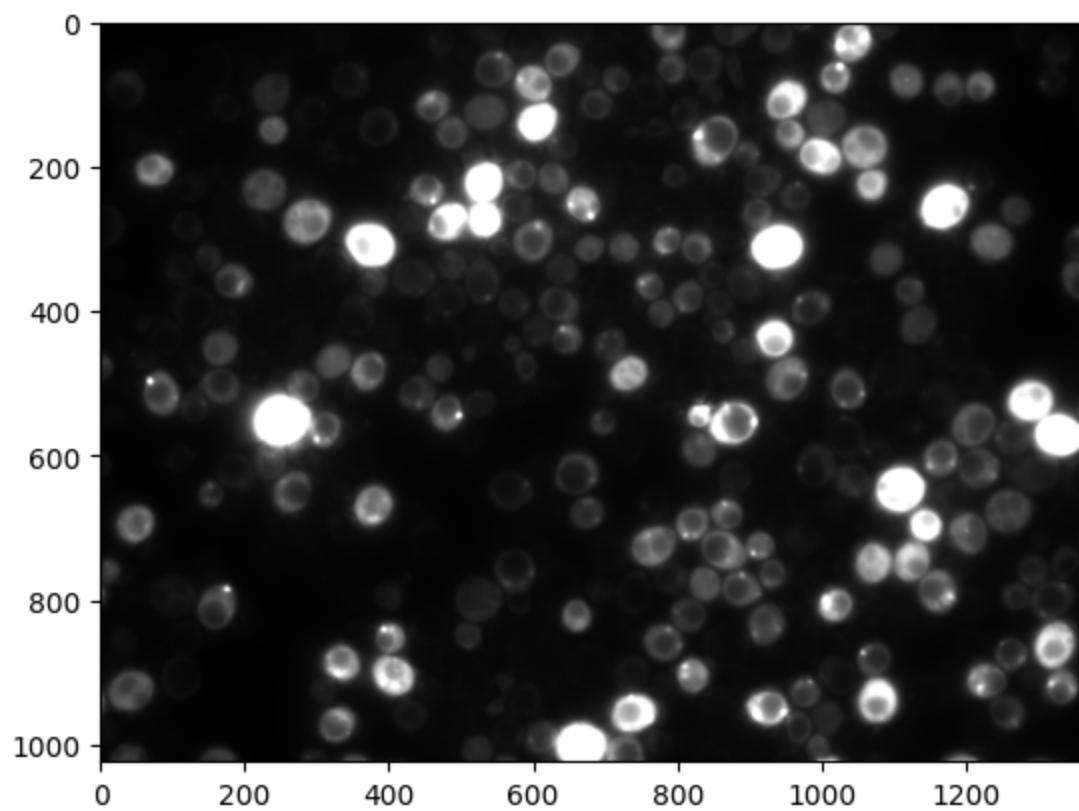
```
In [390... type(image)
```

```
Out[390]: numpy.ndarray
```

```
In [391... image.shape
```

```
Out[391]: (1024, 1360)
```

```
In [392... plt.imshow(image, cmap='gray');
```



```
In [393... image
```

```
Out[393]: array([[219, 225, 220, ..., 256, 258, 272],  
[218, 211, 217, ..., 270, 268, 278],  
[217, 217, 214, ..., 263, 268, 262],  
...,  
[337, 343, 321, ..., 266, 287, 285],
```

```
[320, 323, 339, ..., 268, 295, 281],  
[329, 353, 335, ..., 276, 281, 291]], dtype=uint16)
```

```
In [394... image[0, 0]
```

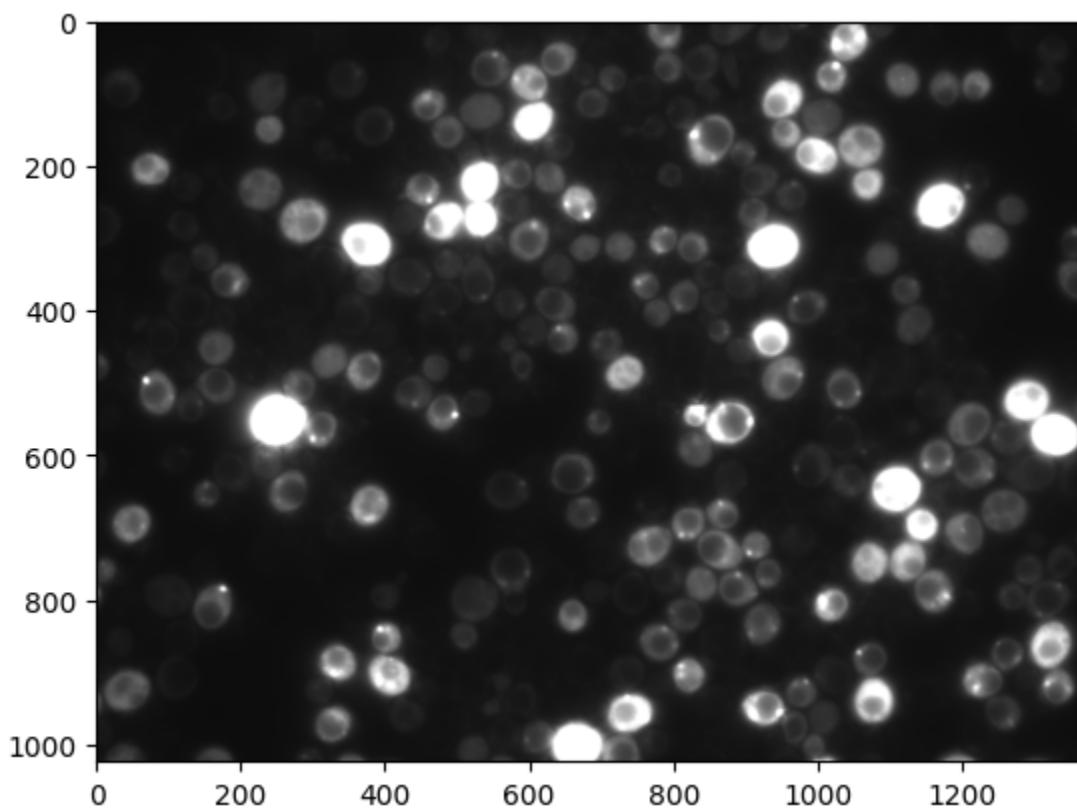
```
Out[394]: 219
```

```
In [395... image[0, 0] = 2
```

```
In [396... image
```

```
Out[396]: array([[ 2, 225, 220, ..., 256, 258, 272],  
[218, 211, 217, ..., 270, 268, 278],  
[217, 217, 214, ..., 263, 268, 262],  
...,  
[337, 343, 321, ..., 266, 287, 285],  
[320, 323, 339, ..., 268, 295, 281],  
[329, 353, 335, ..., 276, 281, 291]], dtype=uint16)
```

```
In [397... plt.imshow(image, cmap='gray');
```

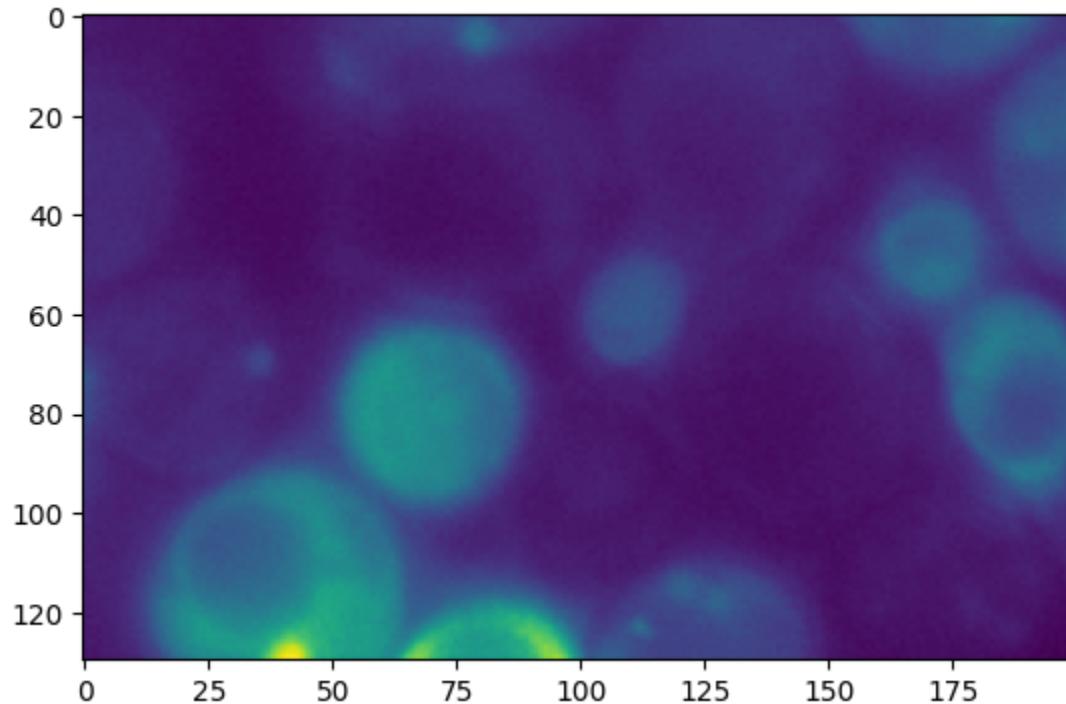


```
In [398... image[400:530, 400:600]
```

```
Out[398]: array([[375, 352, 370, ..., 470, 452, 469],  
[372, 368, 365, ..., 462, 458, 472],  
[381, 370, 359, ..., 478, 461, 480],  
...,  
[349, 365, 346, ..., 287, 285, 290],  
[333, 349, 340, ..., 288, 276, 275],  
[355, 351, 337, ..., 282, 274, 267]], dtype=uint16)
```

```
In [399... cropped = image[400:530, 400:600].copy()
```

```
In [400... plt.imshow(cropped);
```



```
In [401]: cropped.shape
```

```
Out[401]: (130, 200)
```

```
In [402]: image[400:530, :].shape
```

```
Out[402]: (130, 1360)
```

```
In [403]: image[400:, :].shape
```

```
Out[403]: (624, 1360)
```

```
In [404]: np.zeros(shape=(5, 3))
```

```
Out[404]: array([[0., 0., 0.],
                  [0., 0., 0.],
                  [0., 0., 0.],
                  [0., 0., 0.],
                  [0., 0., 0.]])
```

```
In [405]: np.ones(shape=(5, 3))
```

```
Out[405]: array([[1., 1., 1.],
                  [1., 1., 1.],
                  [1., 1., 1.],
                  [1., 1., 1.],
                  [1., 1., 1.]])
```

```
In [406]: np.arange(start=4, stop=12, step=2)
```

```
Out[406]: array([ 4,  6,  8, 10])
```

```
In [407]: np.random.poisson(lam=3, size=(3,5))
```

```
Out[407]: array([[1, 1, 3, 0, 2],
                  [2, 6, 0, 3, 2],
                  [3, 3, 1, 5, 8]])
```

```
In [408]: cropped_plus_three = cropped + 3
```

```
In [409... cropped_plus_three
```

```
Out[409]: array([[378, 355, 373, ..., 473, 455, 472],  
                 [375, 371, 368, ..., 465, 461, 475],  
                 [384, 373, 362, ..., 481, 464, 483],  
                 ...,  
                 [352, 368, 349, ..., 290, 288, 293],  
                 [336, 352, 343, ..., 291, 279, 278],  
                 [358, 354, 340, ..., 285, 277, 270]], dtype=uint16)
```

```
In [410... cropped
```

```
Out[410]: array([[375, 352, 370, ..., 470, 452, 469],  
                 [372, 368, 365, ..., 462, 458, 472],  
                 [381, 370, 359, ..., 478, 461, 480],  
                 ...,  
                 [349, 365, 346, ..., 287, 285, 290],  
                 [333, 349, 340, ..., 288, 276, 275],  
                 [355, 351, 337, ..., 282, 274, 267]], dtype=uint16)
```

```
In [411... cropped * 3  
cropped / 3  
cropped - 3
```

```
Out[411]: array([[372, 349, 367, ..., 467, 449, 466],  
                 [369, 365, 362, ..., 459, 455, 469],  
                 [378, 367, 356, ..., 475, 458, 477],  
                 ...,  
                 [346, 362, 343, ..., 284, 282, 287],  
                 [330, 346, 337, ..., 285, 273, 272],  
                 [352, 348, 334, ..., 279, 271, 264]], dtype=uint16)
```

```
In [412... a = 3
```

```
In [413... a ** 2
```

```
Out[413]: 9
```

```
In [414... cropped ** 2
```

```
Out[414]: array([[ 9553, 58368, 5828, ..., 24292, 7696, 23353],  
                 [ 7312, 4352, 2153, ..., 16836, 13156, 26176],  
                 [14089, 5828, 63345, ..., 31876, 15913, 33792],  
                 ...,  
                 [56265, 2153, 54180, ..., 16833, 15689, 18564],  
                 [45353, 56265, 50064, ..., 17408, 10640, 10089],  
                 [60489, 57665, 48033, ..., 13988, 9540, 5753]], dtype=uint16)
```

```
In [415... np.cos(cropped)
```

```
Out[415]: array([[-0.40805453, 0.98998827, 0.7597075, ..., 0.32583833,  
                  0.925159, -0.61949694],  
                  [ 0.27513435, -0.9074341, 0.8390551, ..., -0.982774,  
                  0.7822497, 0.7240764],  
                  [-0.64689636, 0.7597075, 0.6536208, ..., 0.88795507,  
                  -0.6865085, -0.7877331],  
                  ...,  
                  [-0.96016186, 0.8390551, 0.91111785, ..., -0.44011596,  
                  -0.63334256, 0.5624289],  
                  [ 0.9999611, -0.96016186, 0.75966835, ..., 0.51779556,  
                  0.89598435, 0.11041721],  
                  [-1., 0.65366644, -0.66029406, ..., 0.73621315,  
                  -0.776667, -0.99937433]], dtype=float32)
```

```
In [416... np.max(cropped)
```

```
Out[416]: 1568
```

```
In [417... np.min(cropped)
```

```
Out[417]: 267
```

```
In [418... np.std(cropped)
```

```
Out[418]: 172.53921546746614
```

```
In [419... 172.53921546746614
```

```
Out[419]: 172.53921546746614
```

```
In [420... np.max(cropped)
```

```
Out[420]: 1568
```

```
In [421... cropped.max()
```

```
Out[421]: 1568
```

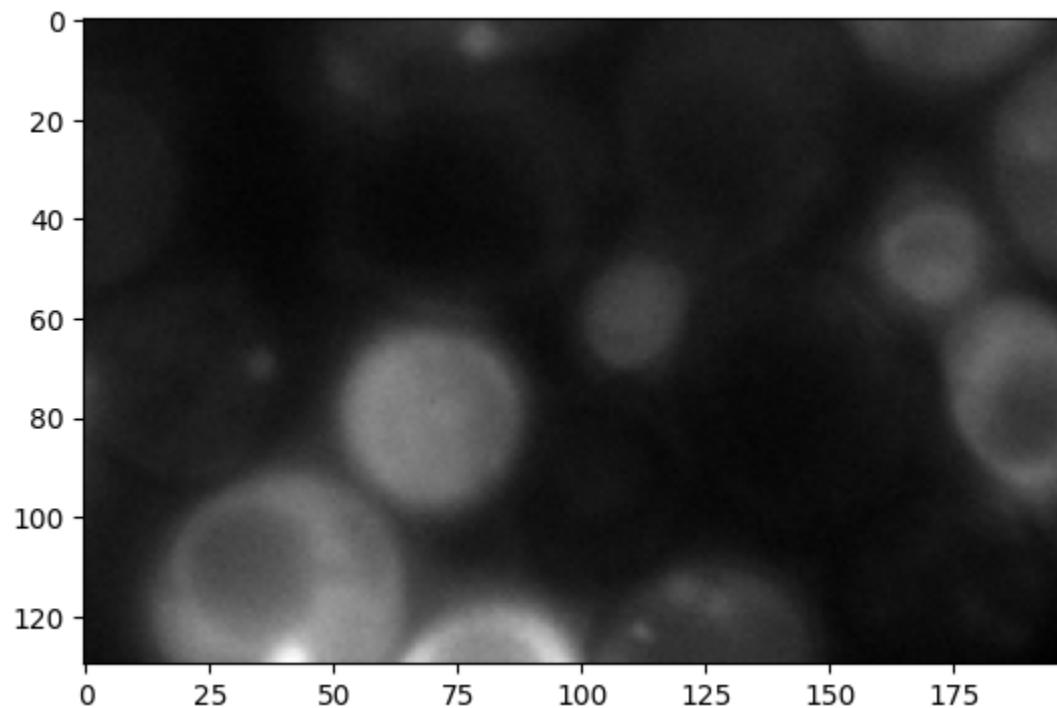
```
In [422... cropped.shape
```

```
Out[422]: (130, 200)
```

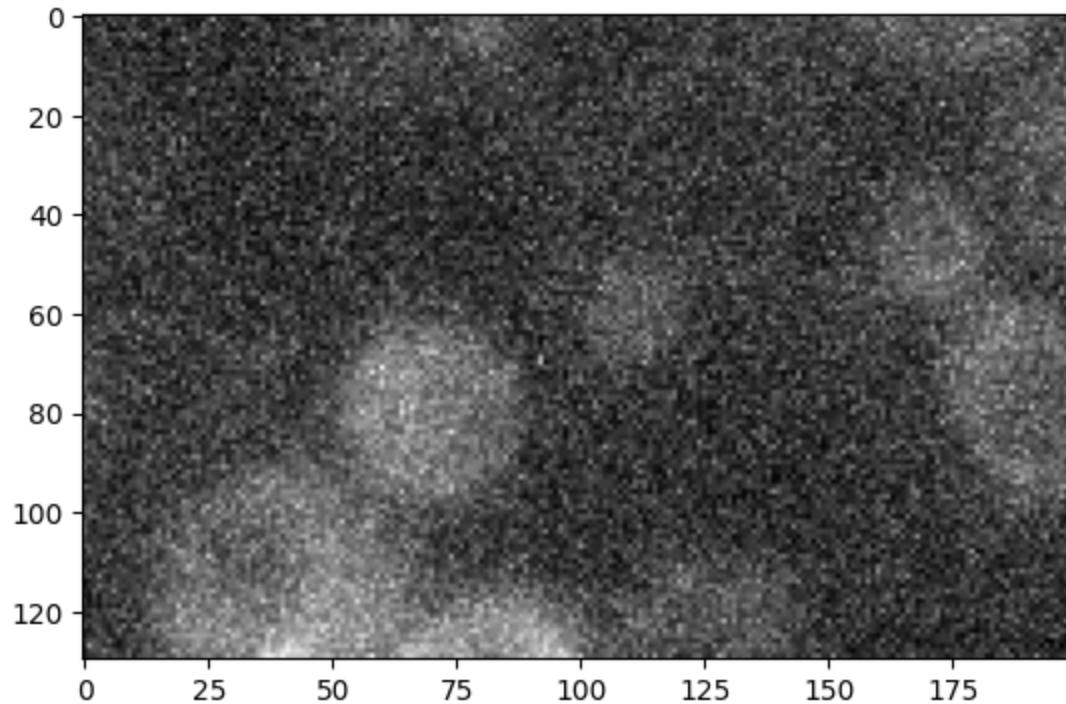
```
In [423... noise_image = np.random.poisson(lam=3, size=cropped.shape)
```

```
In [424... corrupted = cropped + 100*noise_image
```

```
In [425... plt.imshow(cropped, cmap='gray');
```



```
In [426... plt.imshow(corrupted, cmap='gray');
```



```
In [427]: a = 2
```

```
In [428]: a > 3
```

```
Out[428]: False
```

```
In [429]: a < 3
```

```
Out[429]: True
```

```
In [430]: out = a > 3  
out
```

```
Out[430]: False
```

```
In [431]: type(out)
```

```
Out[431]: bool
```

```
In [432]: cropped
```

```
Out[432]: array([[375, 352, 370, ..., 470, 452, 469],  
                  [372, 368, 365, ..., 462, 458, 472],  
                  [381, 370, 359, ..., 478, 461, 480],  
                  ...,  
                  [349, 365, 346, ..., 287, 285, 290],  
                  [333, 349, 340, ..., 288, 276, 275],  
                  [355, 351, 337, ..., 282, 274, 267]], dtype=uint16)
```

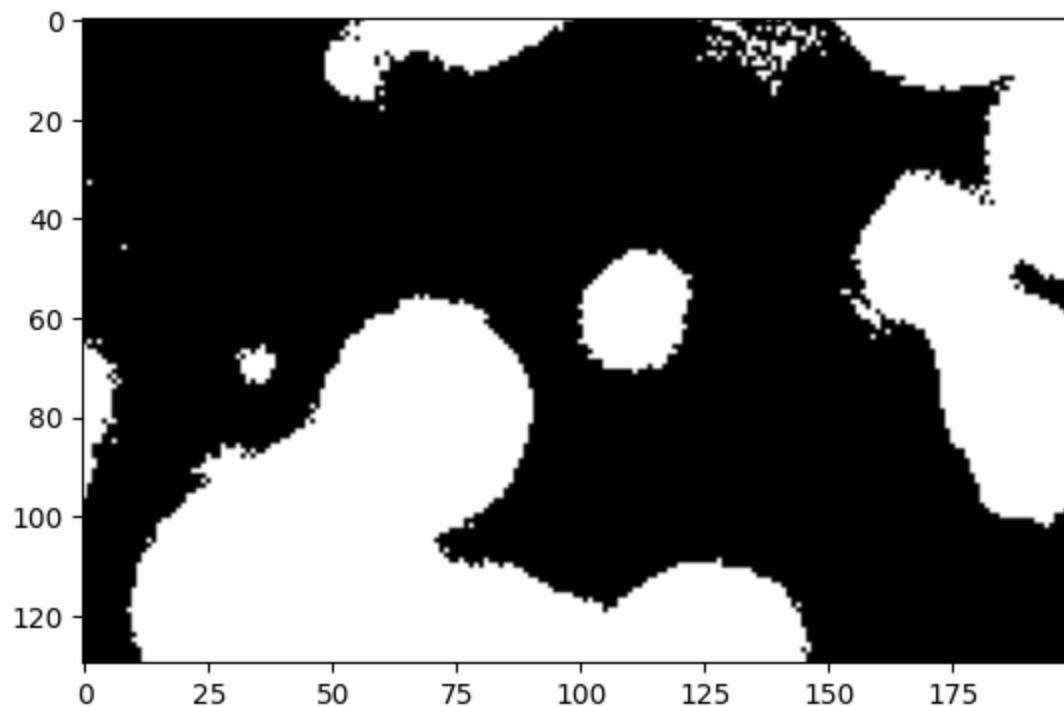
```
In [433]: cropped > 450
```

```
Out[433]: array([[False, False, False, ..., True, True, True],  
                  [False, False, False, ..., True, True, True],  
                  [False, False, False, ..., True, True, True],  
                  ...,  
                  [False, False, False, ..., False, False, False],  
                  [False, False, False, ..., False, False, False],  
                  [False, False, False, ..., False, False, False]])
```

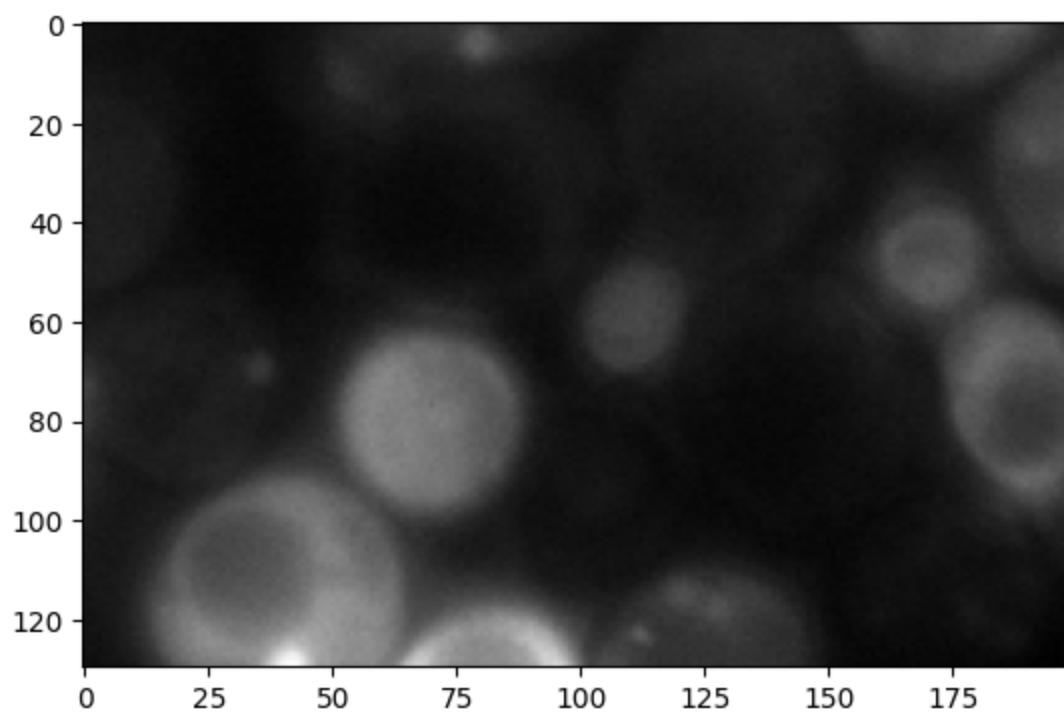
```
In [434]: array_bool = cropped > 450
```

```
In [435]: plt.imshow(array_bool, cmap='gray')
```

```
Out[435]: <matplotlib.image.AxesImage at 0x1d0912de750>
```



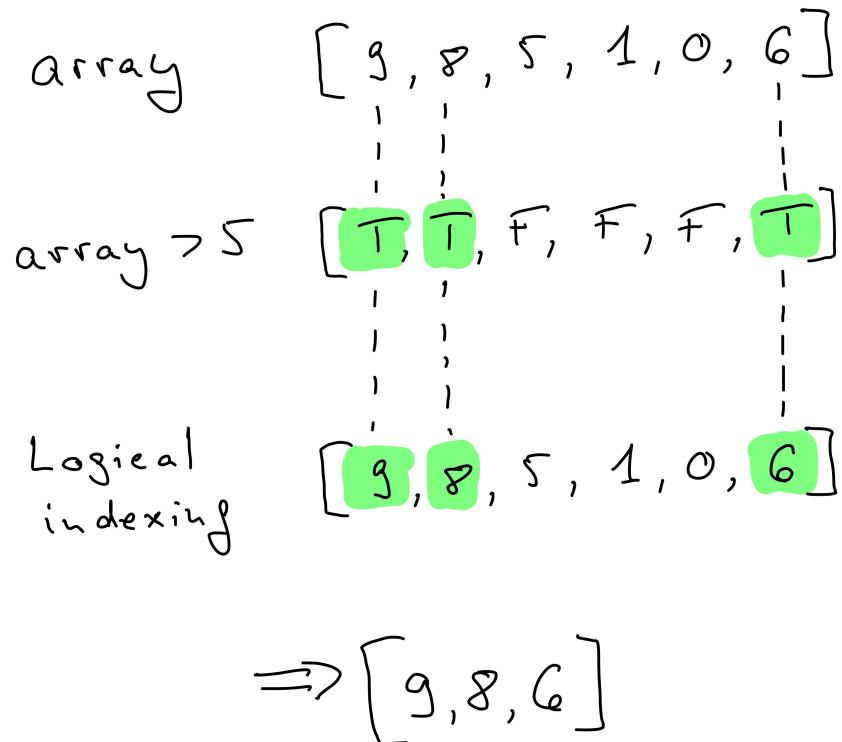
```
In [436]: plt.imshow(cropped, cmap='gray');
```



```
In [437]: from IPython.display import Image
```

```
Image(url='https://github.com/guiwitz/ISDAwPython_day2/raw/master/images/logical_indexin
```

```
Out[437]:
```

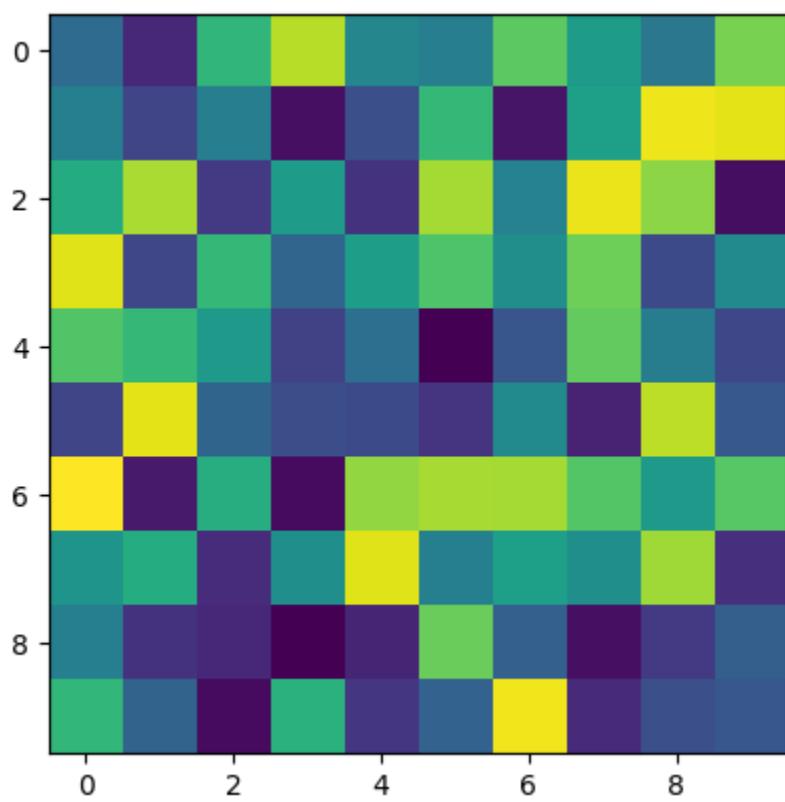


```
In [438]: cropped[array_bool]
Out[438]: array([468, 466, 465, ..., 496, 488, 472], dtype=uint16)
```

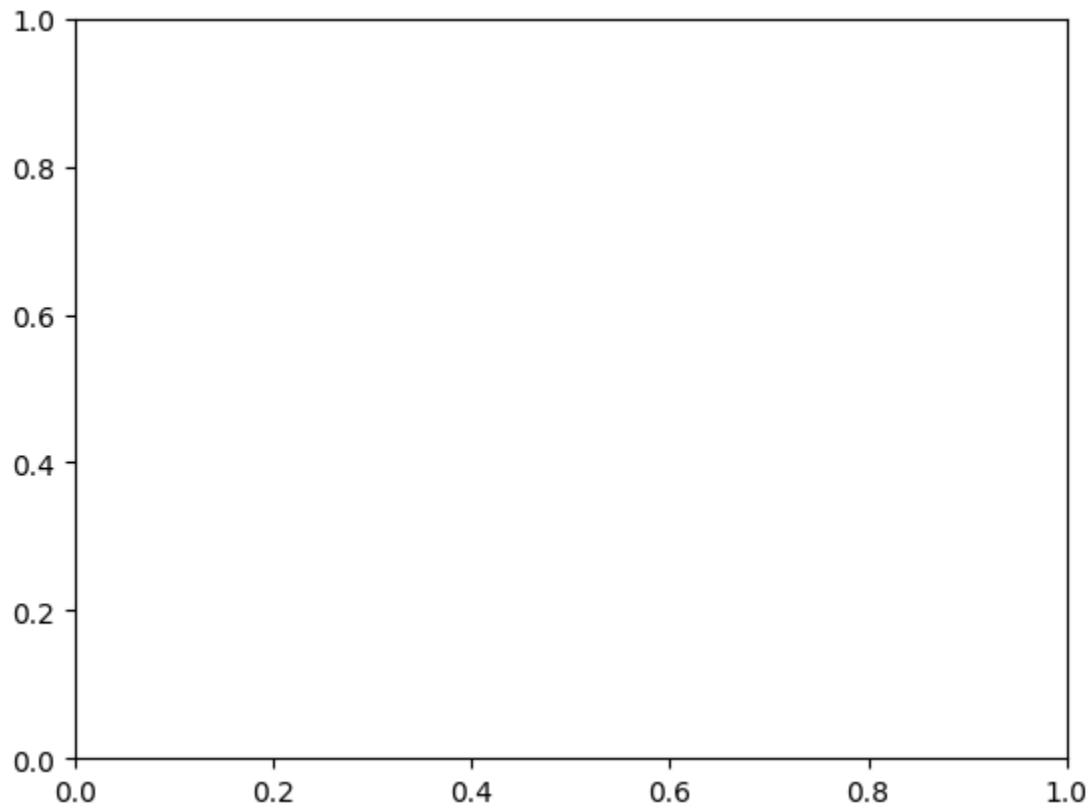
```
In [439]: extracted_pixels = cropped[array_bool]
extracted_pixels.mean()
```

```
Out[439]: 658.8238455632335
```

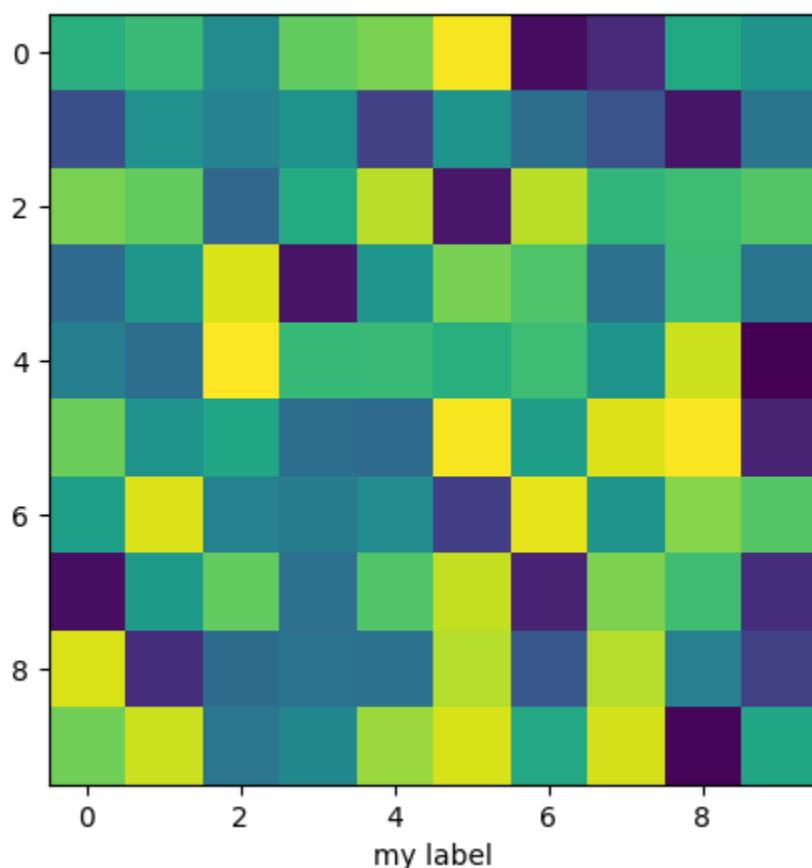
```
In [440]: import numpy as np
plt.imshow(np.random.randint(0, 255, (10, 10)));
```



```
In [441]: fig, ax = plt.subplots()
```



```
In [442]: fig, ax = plt.subplots(figsize=(5,5))
ax.imshow(np.random.randint(0,255,(10,10)));
ax.set_xlabel('my label');
```



```
In [443]: import skimage.io  
image = skimage.io.imread('https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif')
```

```
In [444]: image.shape
```

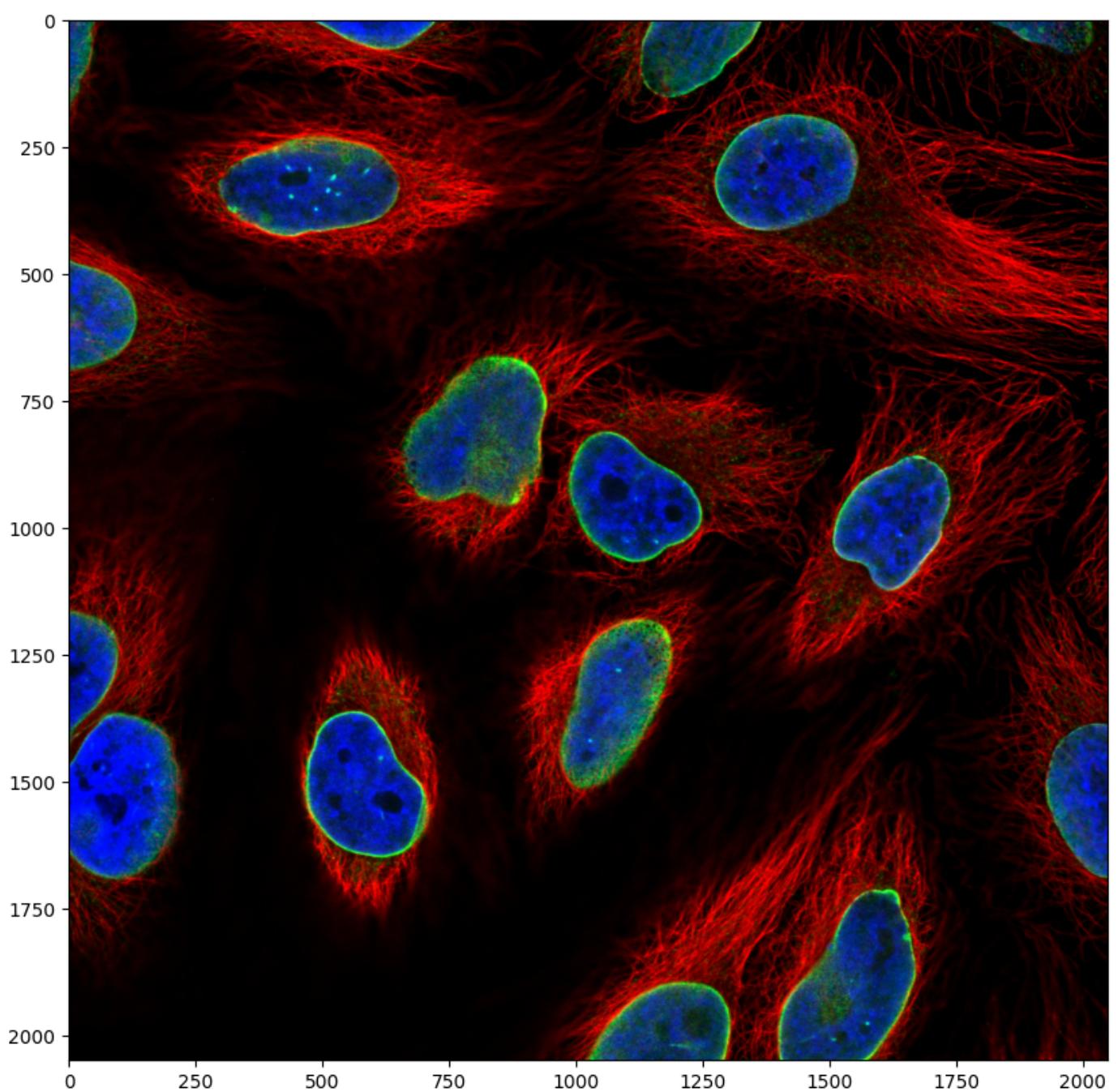
```
Out[444]: (1024, 1360)
```

```
In [445]: image_rgb = skimage.io.imread('https://github.com/guiwitz/PyImageCourse_beginner/raw/mas
```

```
In [446]: image_rgb.shape
```

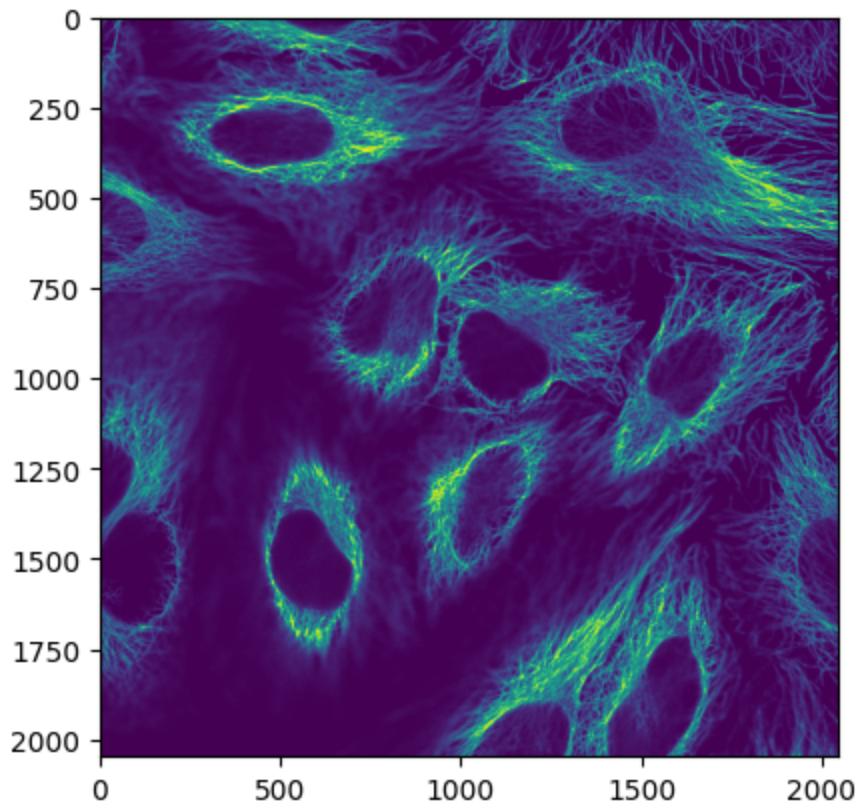
```
Out[446]: (2048, 2048, 3)
```

```
In [447]: fig, ax = plt.subplots(figsize=(10,10))  
ax.imshow(image_rgb);
```

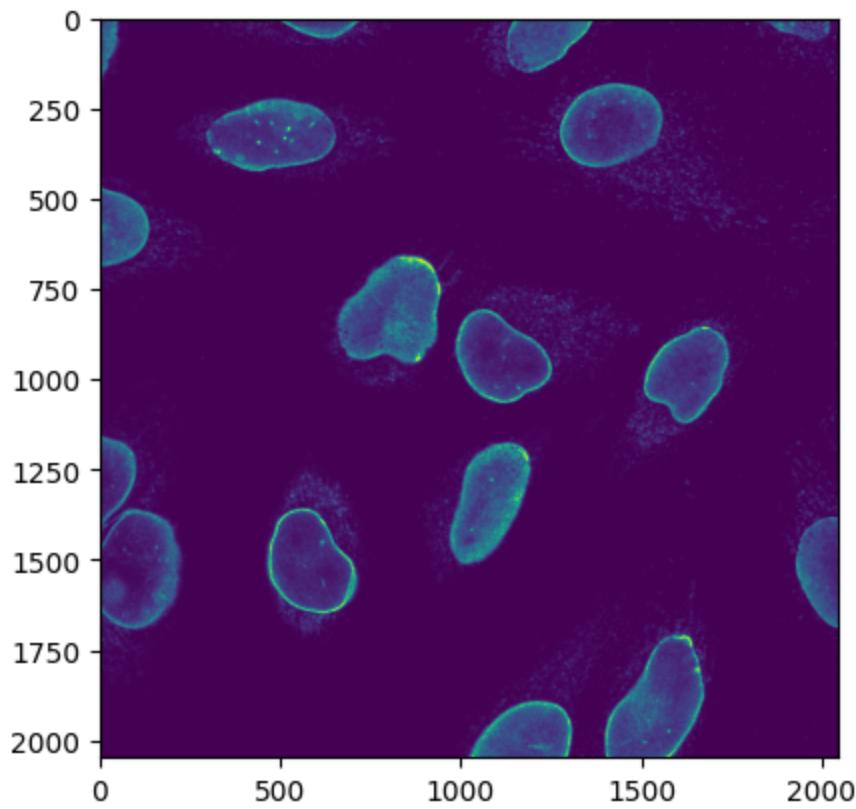


```
In [448]: image_channel1 = image_rgb[:, :, 0]
```

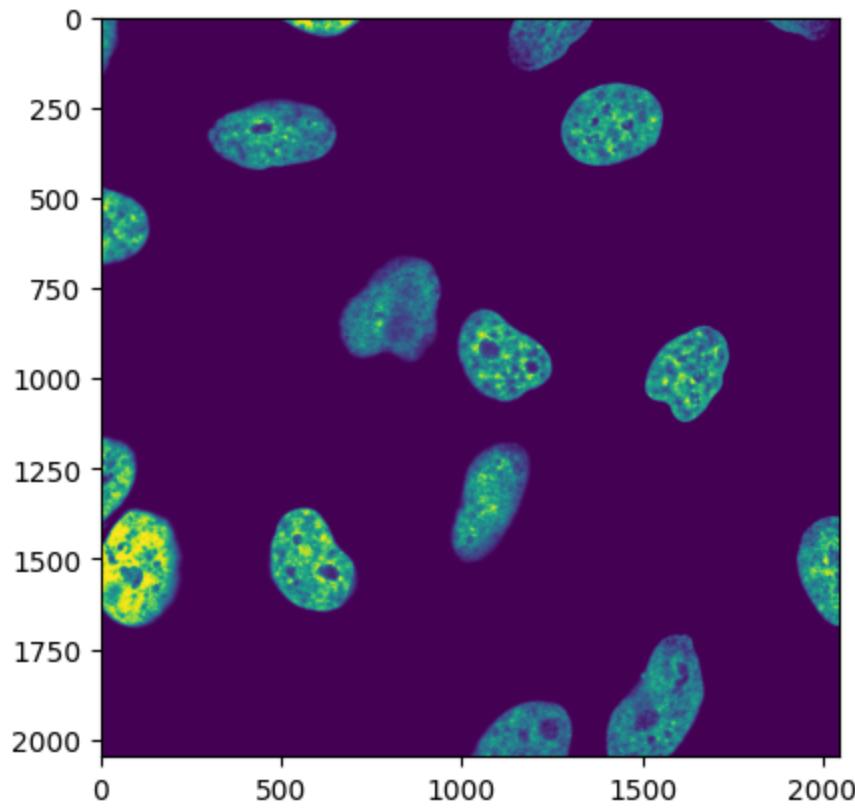
```
In [449]: plt.imshow(image_channel1);
```



```
In [450]: image_channel2 = image_rgb[:, :, 1]
plt.imshow(image_channel2);
```



```
In [451]: image_channel3 = image_rgb[:, :, 2]
plt.imshow(image_channel3);
```



```
In [452]: image_channel1.shape
```

```
Out[452]: (2048, 2048)
```

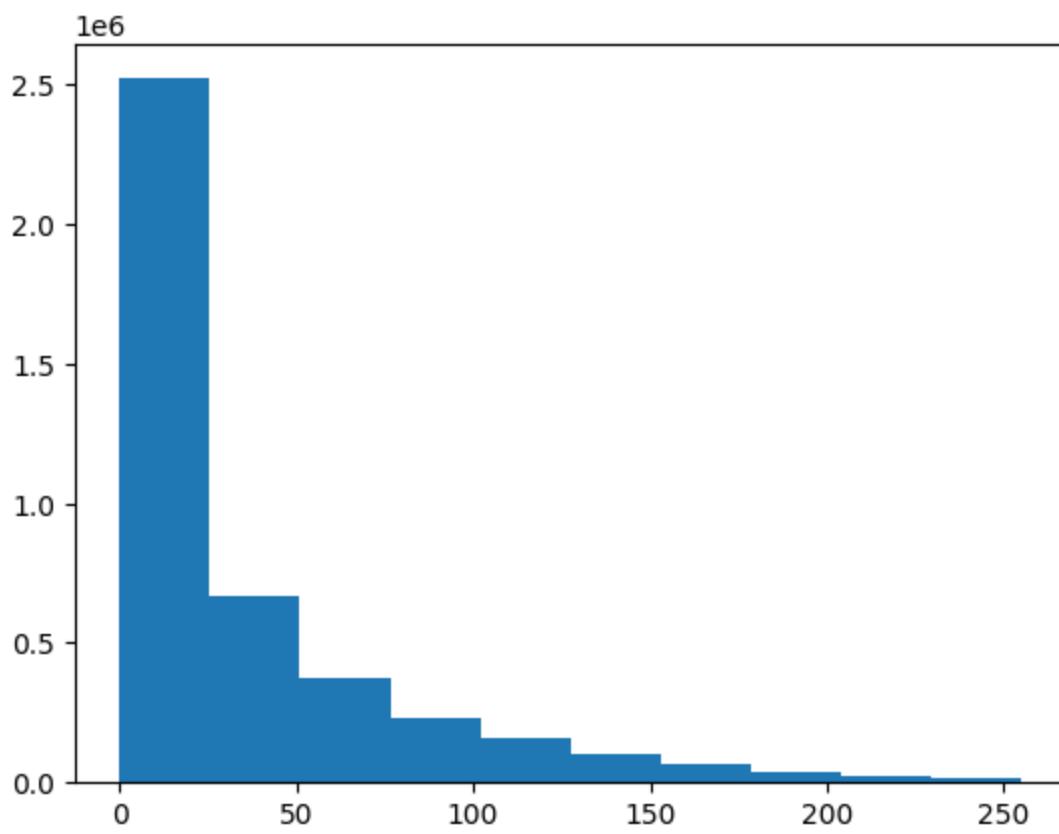
```
In [453]: 2048 * 2048
```

```
Out[453]: 4194304
```

```
In [454]: image_channel1.ravel().shape
```

```
Out[454]: (4194304,)
```

```
In [455]: plt.hist(image_channel1.ravel());
```



```
In [456]: image_channel1.max()
```

```
Out[456]: 255
```

```
In [457]: image_channel1.dtype
```

```
Out[457]: dtype('uint8')
```

```
In [458]: image_channel1.dtype
```

```
Out[458]: dtype('uint8')
```

```
In [459]: image_channel1[0:3, 0:3]
```

```
Out[459]: array([[13, 15, 22],  
                  [22, 29, 36],  
                  [14, 22, 25]], dtype=uint8)
```

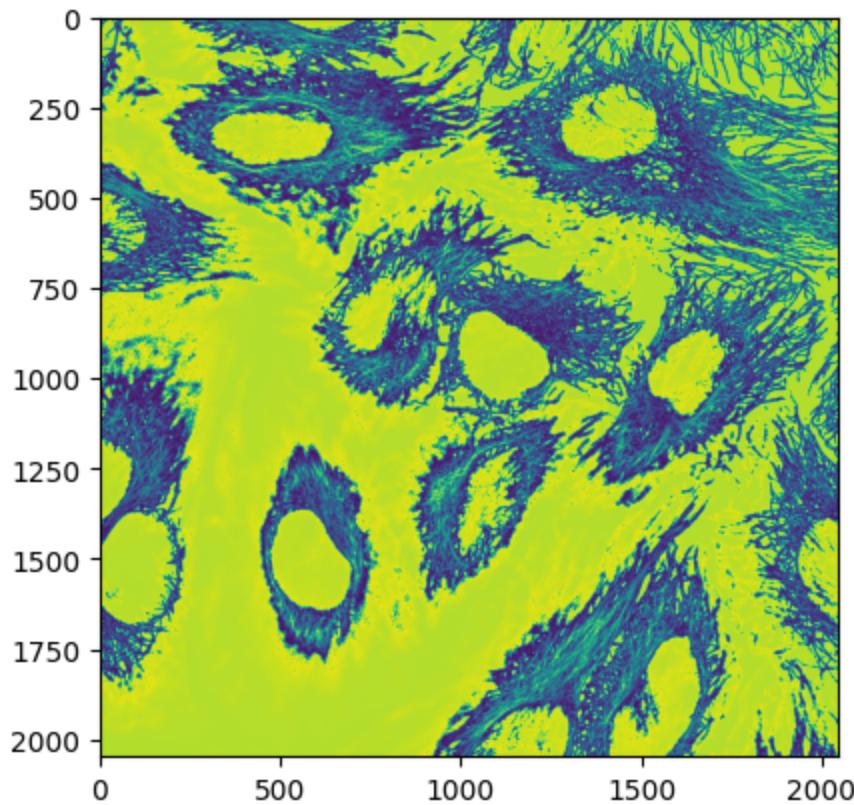
```
In [460]: image_channel1[0:3, 0:3] - 10
```

```
Out[460]: array([[ 3,  5, 12],  
                  [12, 19, 26],  
                  [ 4, 12, 15]], dtype=uint8)
```

```
In [461]: image_channel1[0:3, 0:3] - 30
```

```
Out[461]: array([[239, 241, 248],  
                  [248, 255,   6],  
                  [240, 248, 251]], dtype=uint8)
```

```
In [462]: plt.imshow(image_channel1-30);
```



```
In [463]: import numpy as np  
  
image_channel1_float = image_channel1.astype(np.float16)
```

```
In [464]: image_channel1_float[0:3, 0:3]
```

```
Out[464]: array([[13., 15., 22.],  
                  [22., 29., 36.],  
                  [14., 22., 25.]], dtype=float16)
```

```
In [465]: image_channel1_float[0:3, 0:3] - 30
```

```
Out[465]: array([[-17., -15., -8.],  
                  [-8., -1., 6.],  
                  [-16., -8., -5.]], dtype=float16)
```

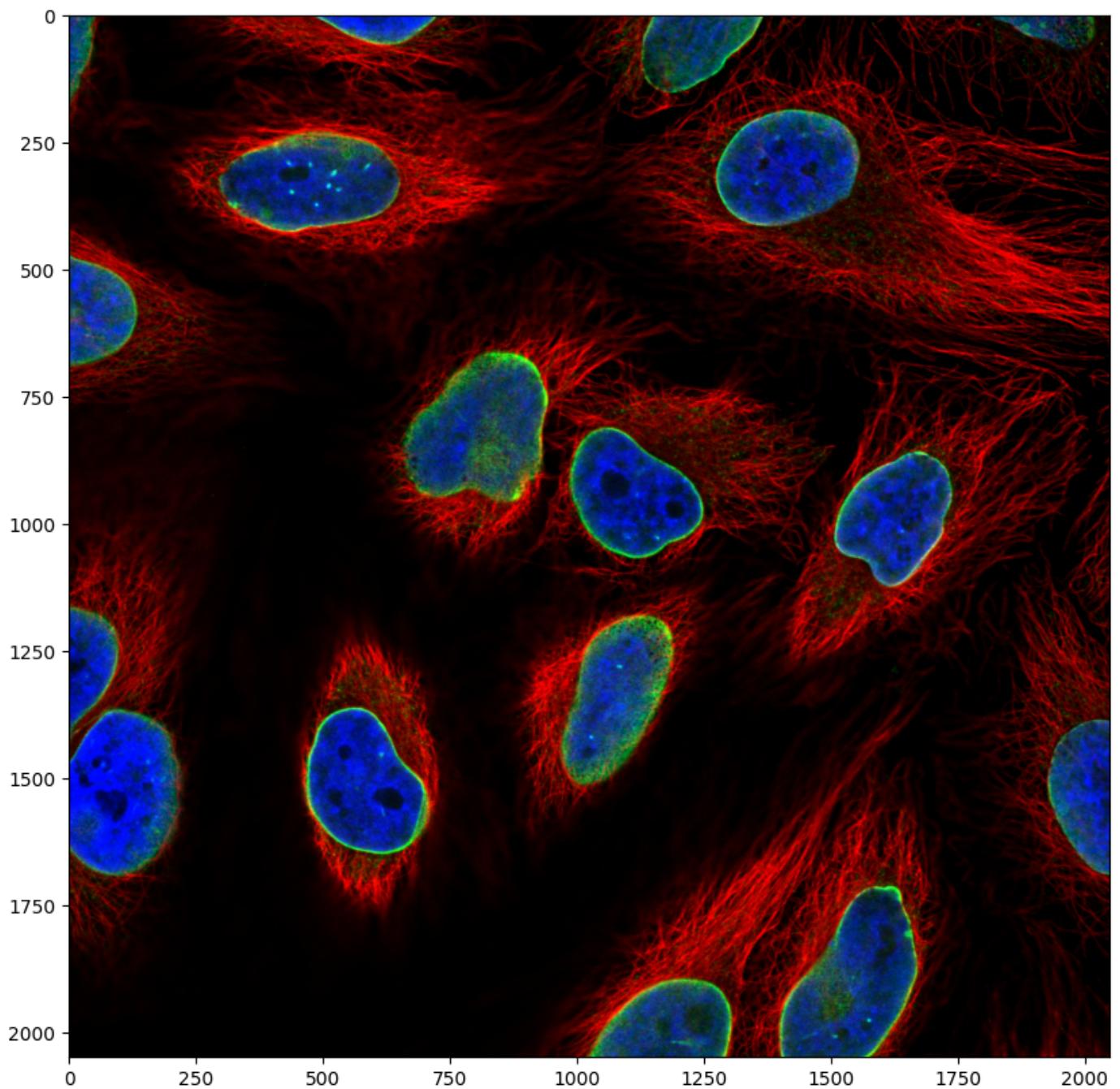
```
In [466]: import numpy as np  
import matplotlib.pyplot as plt  
import skimage  
import skimage.io
```

```
In [467]: #image_stack = skimage.io.imread('images/46658_784_B12_1.tif')  
image_stack = skimage.io.imread('https://github.com/guiwitz/PyImageCourse_beginner/raw/m
```

```
In [468]: image_stack.shape
```

```
Out[468]: (2048, 2048, 3)
```

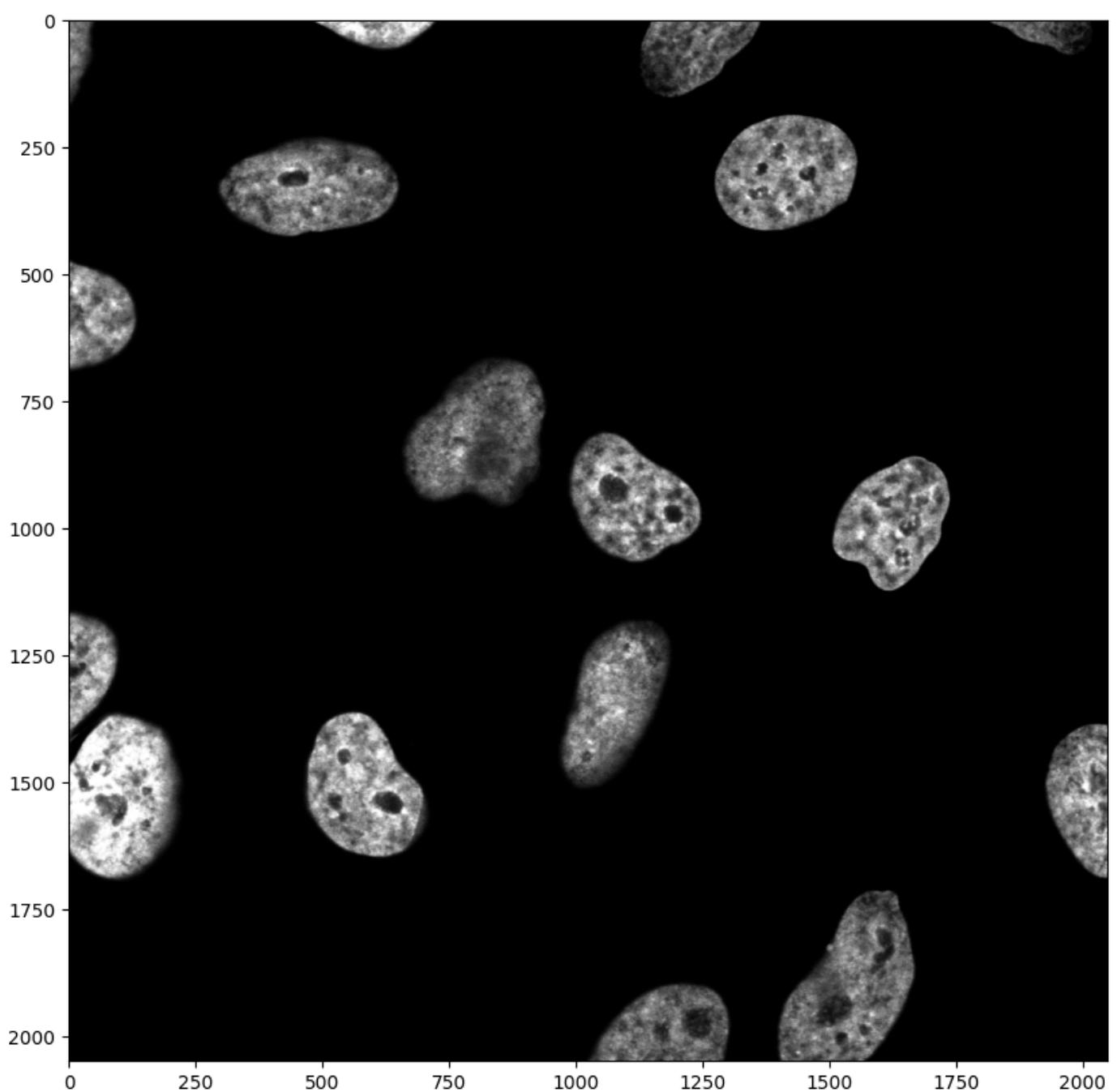
```
In [469]: plt.subplots(figsize=(10,10))  
plt.imshow(image_stack);
```



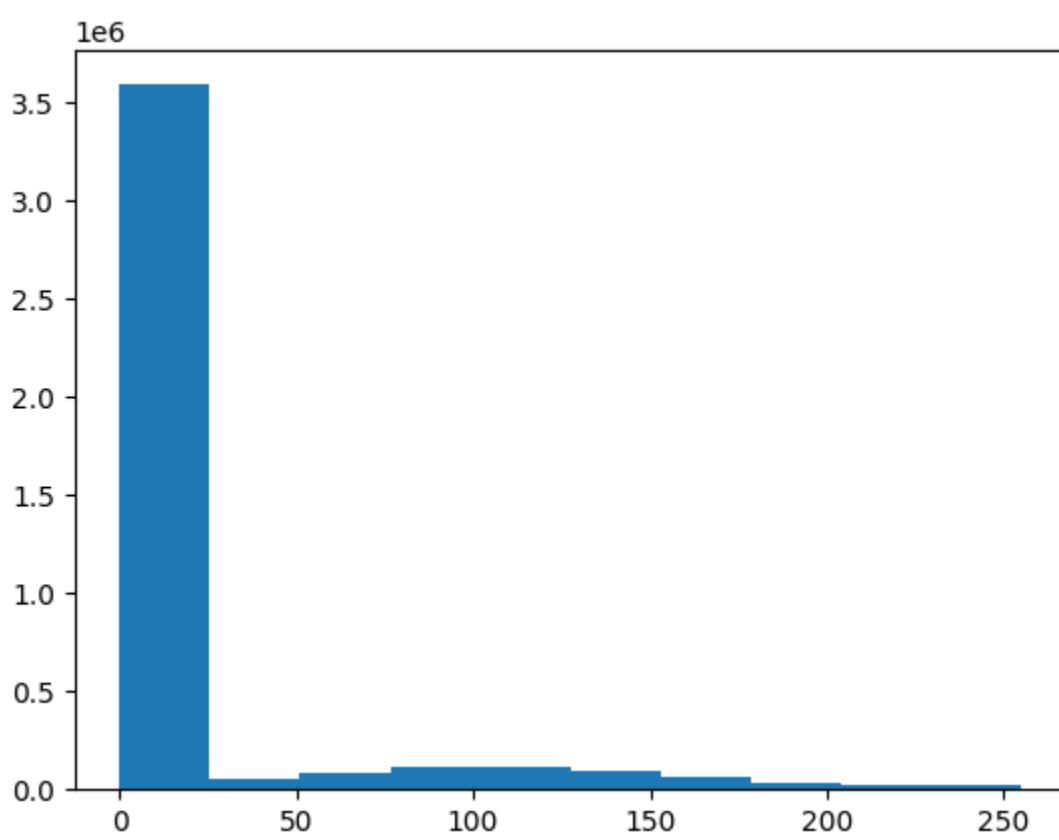
```
In [470...]: image_nuclei = image_stack[:, :, 2]
```

```
In [471...]: image_nuclei = image_stack[:, :, 2]
```

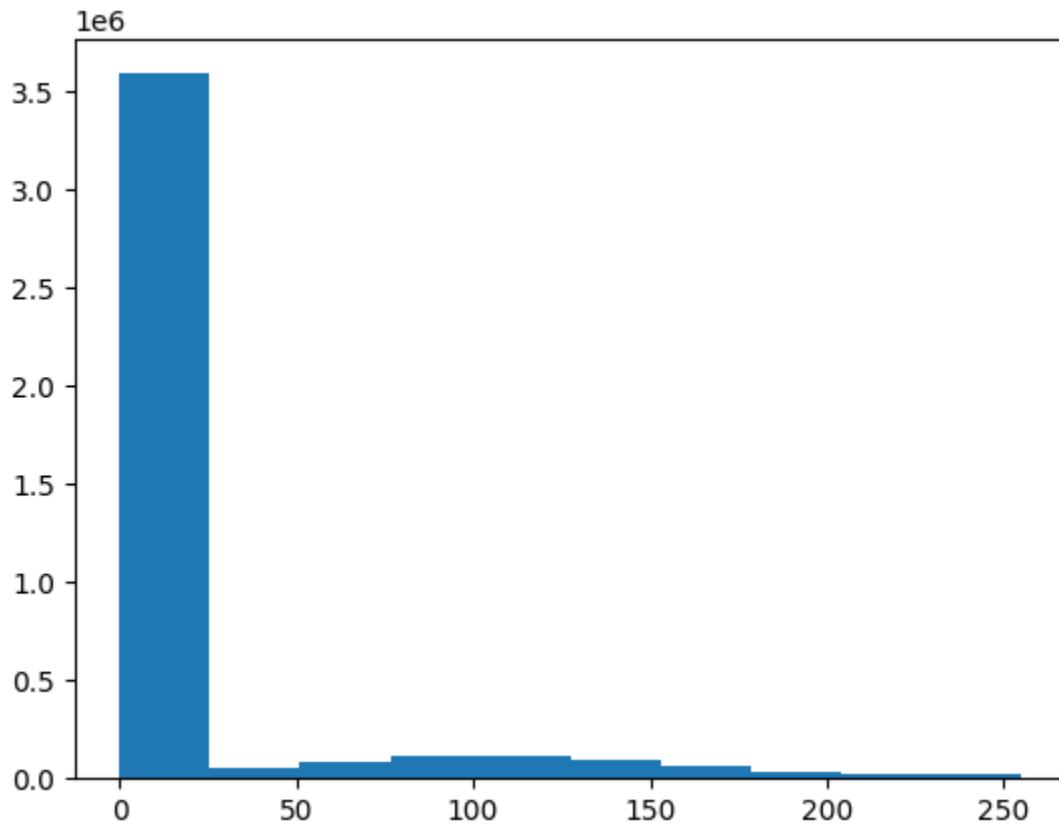
```
In [472...]: plt.subplots(figsize=(10, 10))
plt.imshow(image_nuclei, cmap = 'gray');
```



```
In [473]: plt.hist(np.ravel(image_nuclei));
```

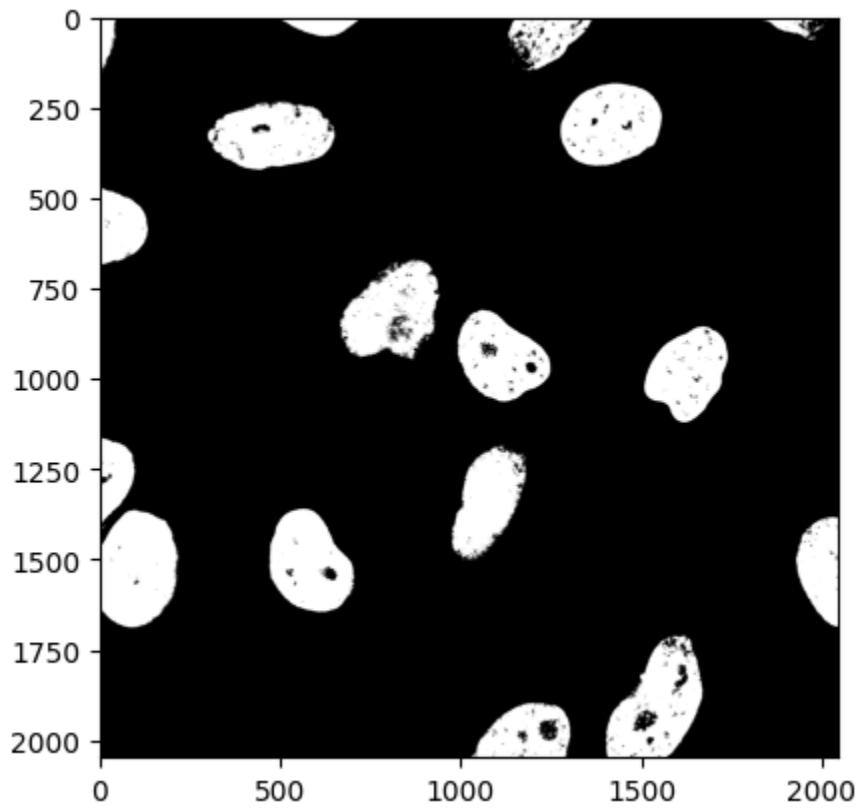


```
In [474...]: plt.hist(np.ravel(image_nuclei));
```

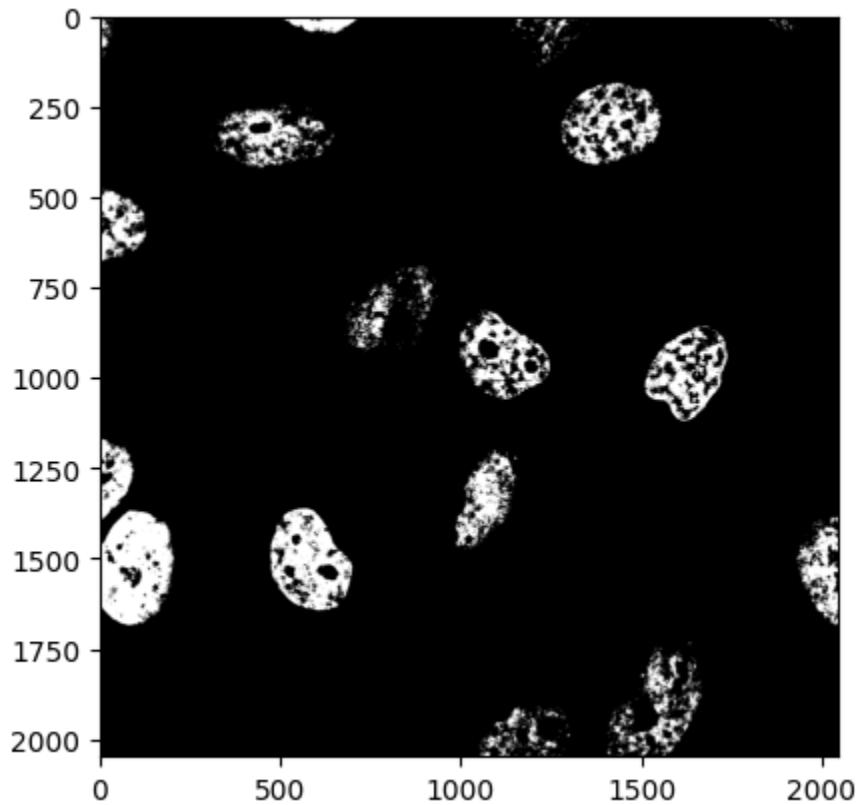


```
In [475...]: mask = image_nuclei > 50
```

```
In [476...]: plt.imshow(mask, cmap = 'gray');
```



```
In [477]: mask = image_nuclei > 120  
plt.imshow(mask, cmap = 'gray');
```



```
In [478]: import skimage.filters  
  
help(skimage.filters.threshold_otsu)  
  
Help on function threshold_otsu in module skimage.filters.thresholding:  
  
threshold_otsu(image=None, nbins=256, *, hist=None)  
    Return threshold value based on Otsu's method.
```

Either image or hist must be provided. If hist is provided, the actual histogram of the image is ignored.

Parameters

image : (N, M[, ..., P]) ndarray, optional
 Grayscale input image.
nbins : int, optional
 Number of bins used to calculate histogram. This value is ignored for
 integer arrays.
hist : array, or 2-tuple of arrays, optional
 Histogram from which to determine the threshold, and optionally a
 corresponding array of bin center intensities. If no hist provided,
 this function will compute it from the image.

Returns

threshold : float
 Upper threshold value. All pixels with an intensity higher than
 this value are assumed to be foreground.

References

.. [1] Wikipedia, https://en.wikipedia.org/wiki/Otsu's_Method

Examples

>>> from skimage.data import camera
>>> image = camera()
>>> thresh = threshold_otsu(image)
>>> binary = image <= thresh

Notes

The input image must be grayscale.

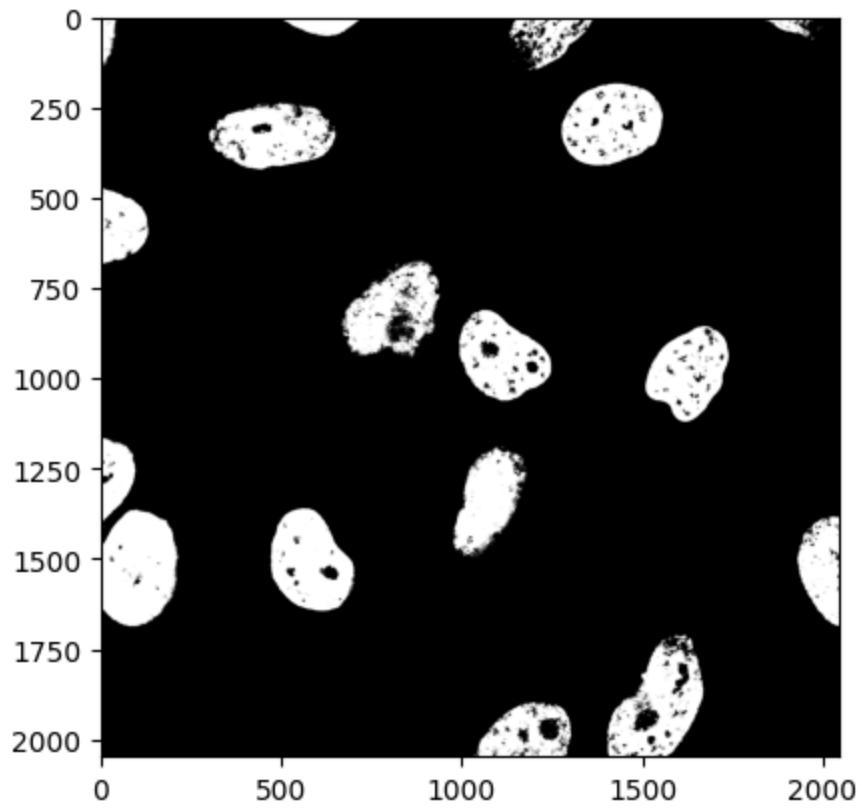
```
In [479...]: my_otsu_threshold = skimage.filters.threshold_otsu(image_nuclei)
print(my_otsu_threshold)
```

66

```
In [480...]: mask_nuclei = image_nuclei > my_otsu_threshold
```

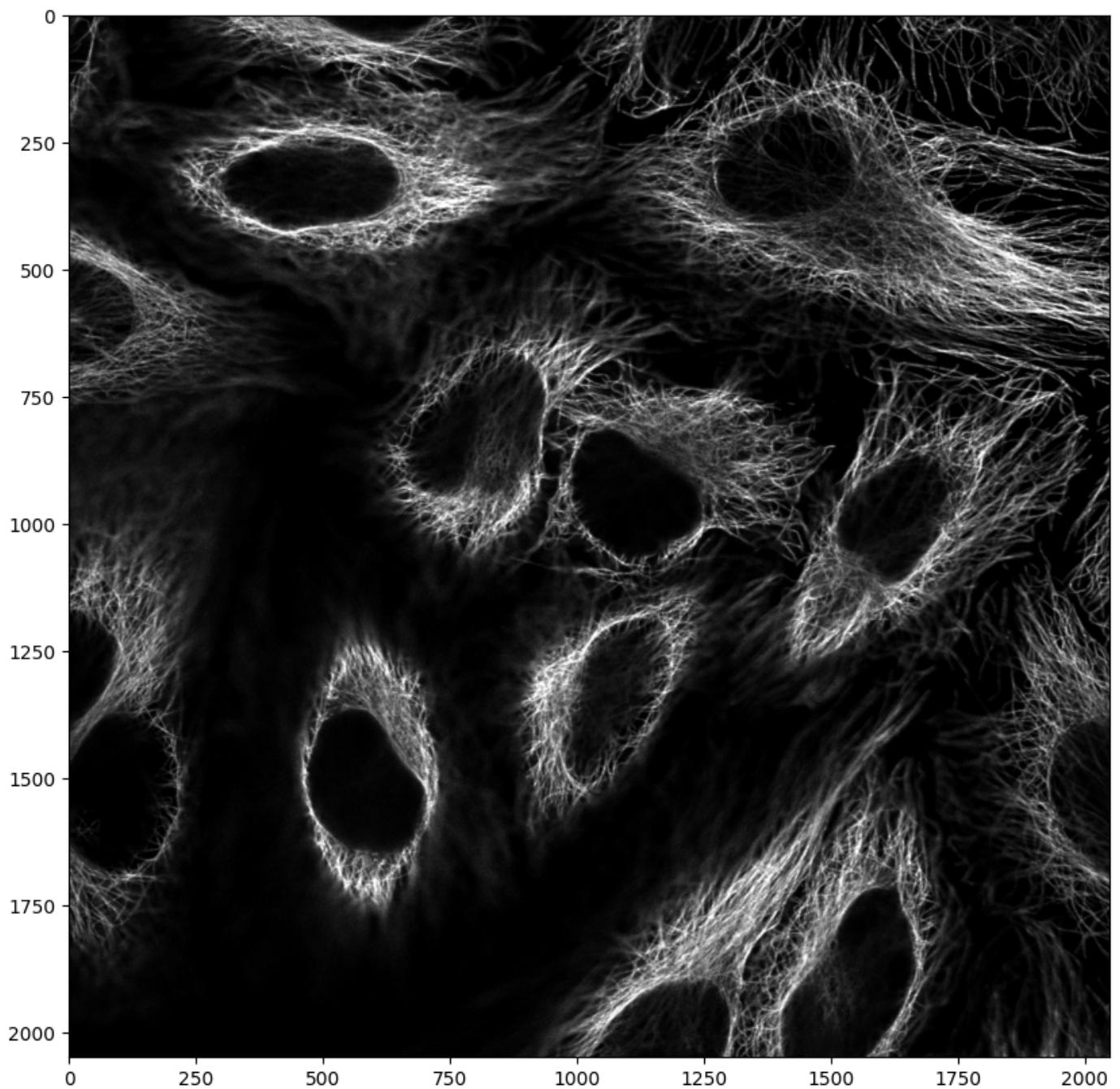
```
In [481...]: mask_nuclei = image_nuclei > my_otsu_threshold
```

```
In [482...]: plt.imshow(mask_nuclei, cmap = 'gray');
```



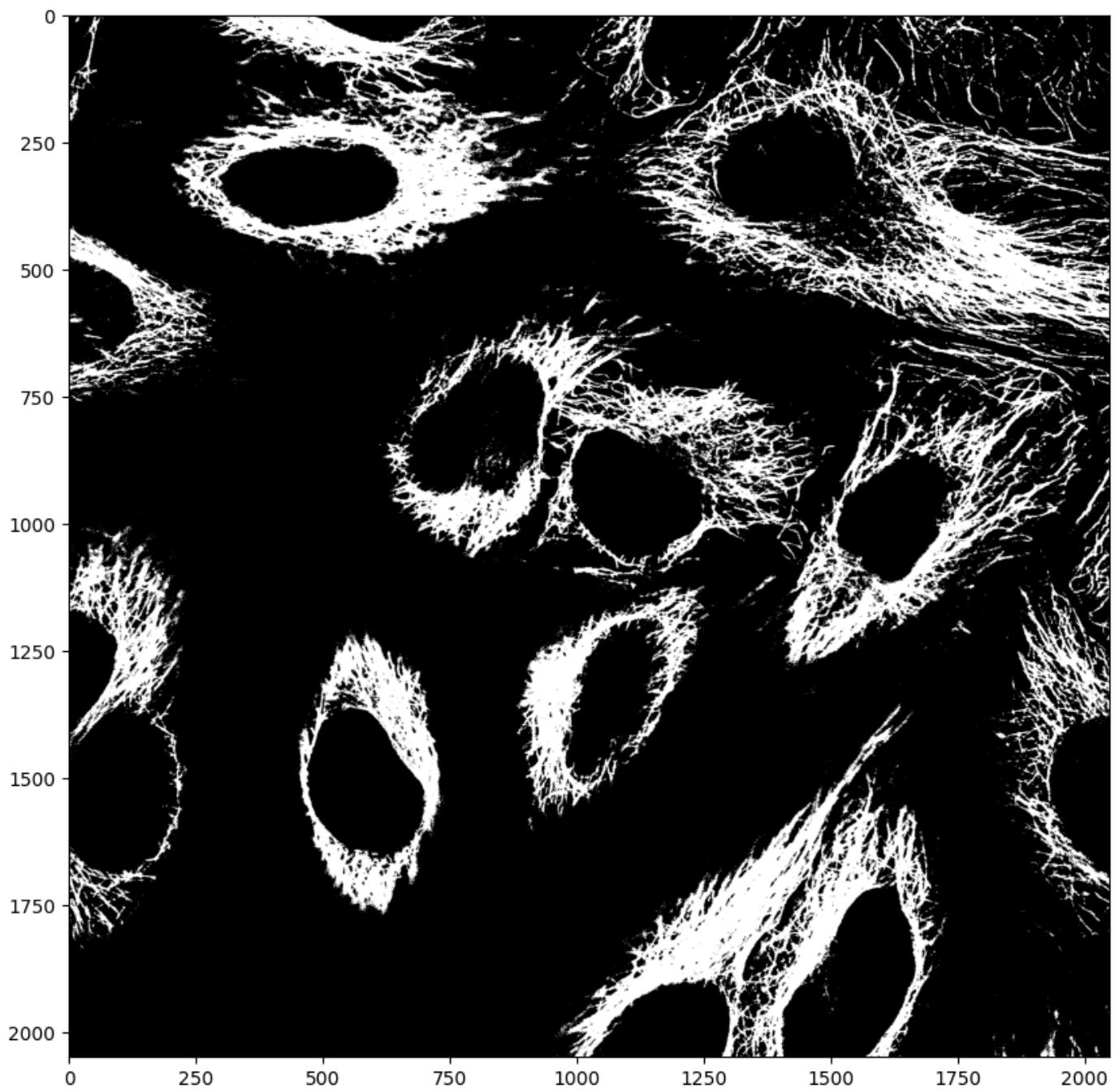
```
In [483]: image_cells = image_stack[:, :, 0]
```

```
In [484]: plt.subplots(figsize=(10,10))
plt.imshow(image_cells, cmap = 'gray');
```



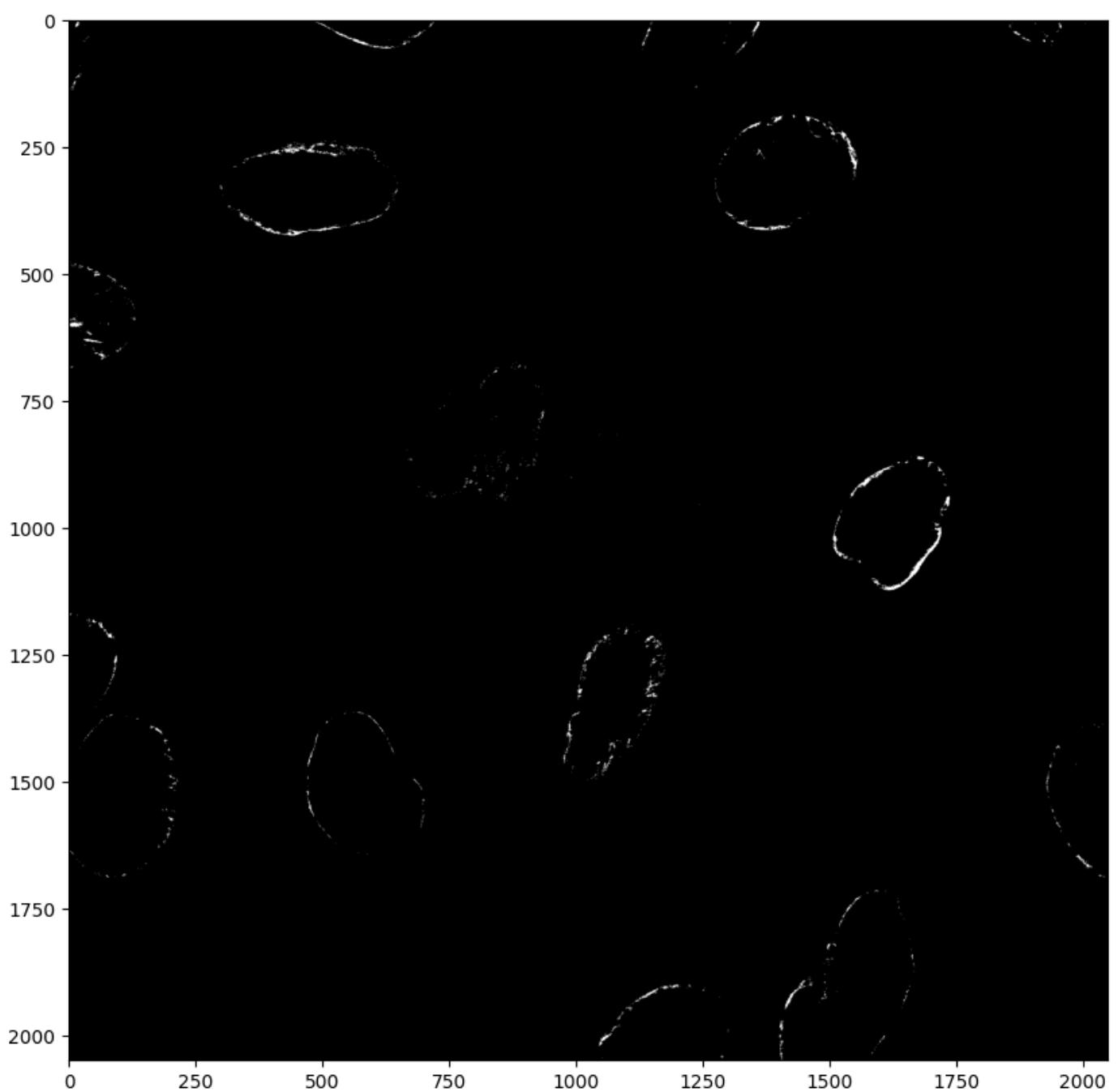
```
In [485]: mask_cells = image_cells > skimage.filters.threshold_otsu(image_cells)
```

```
In [486]: plt.subplots(figsize=(10,10))
plt.imshow(mask_cells, cmap = 'gray');
```

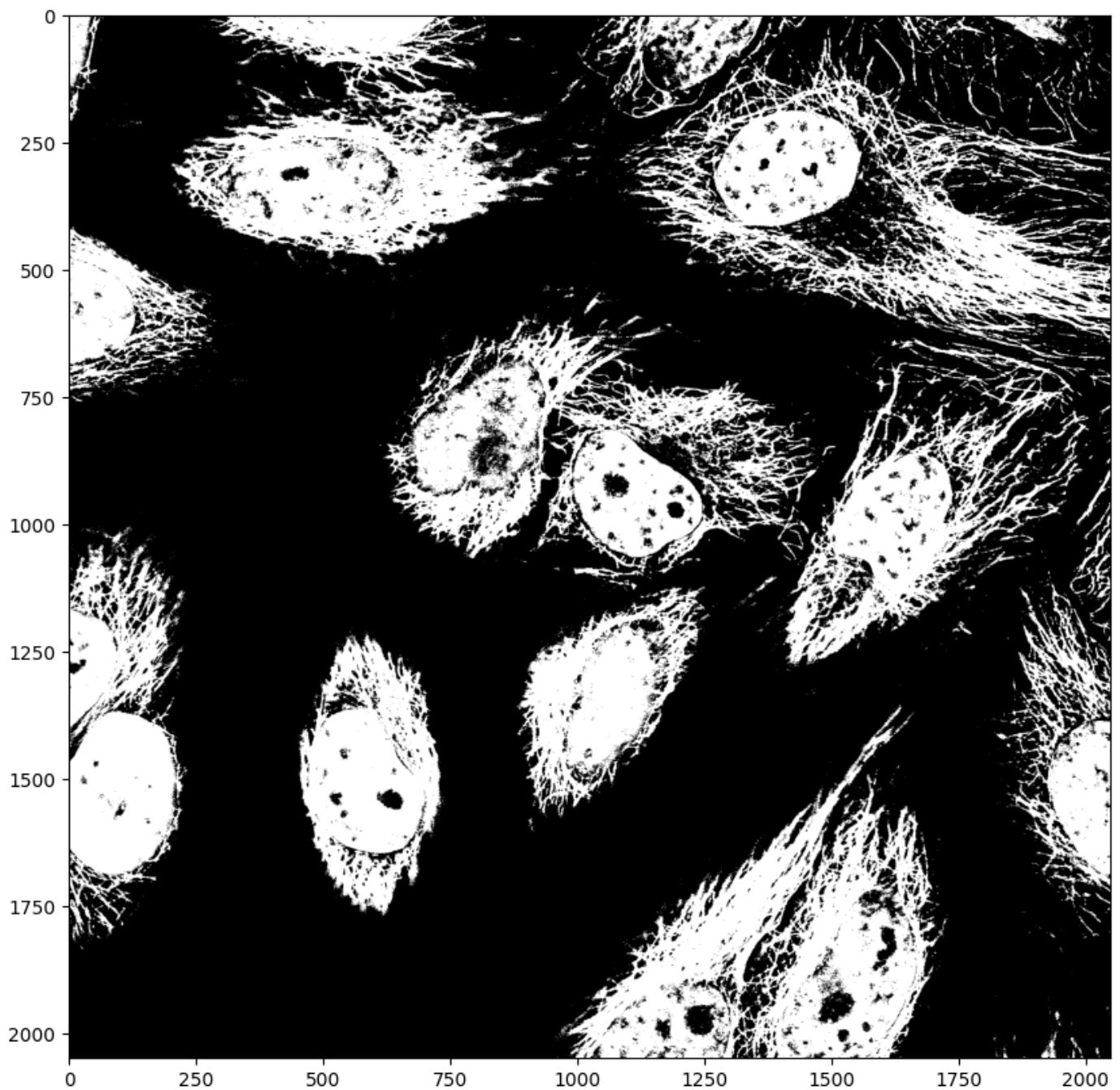


```
In [487]: both_masks = mask_cells * mask_nuclei
```

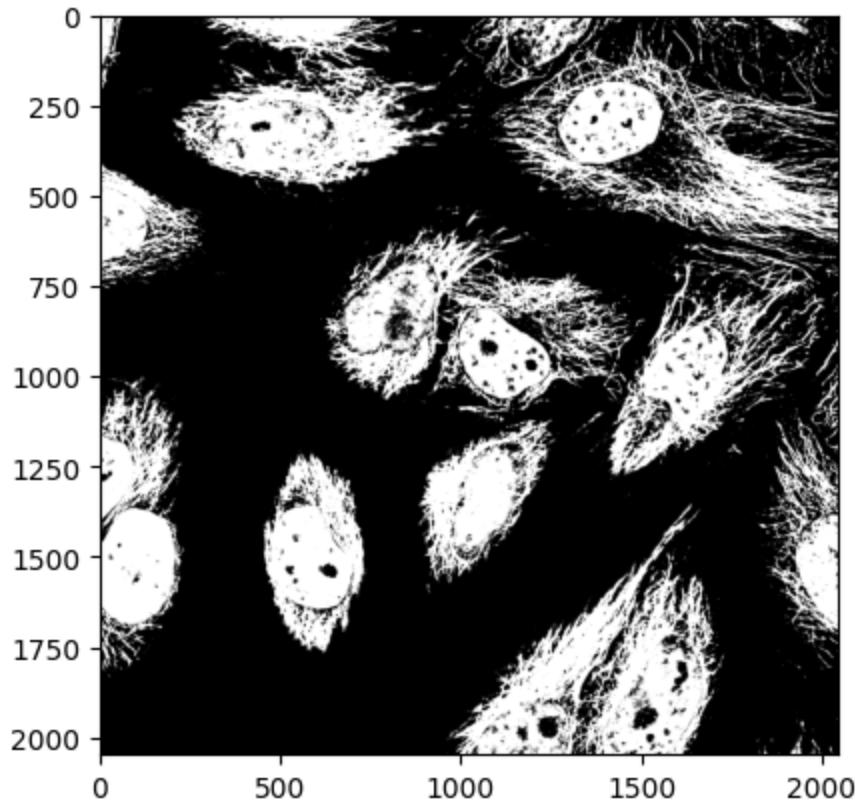
```
In [488]: plt.subplots(figsize=(10,10))
plt.imshow(both_masks, cmap = 'gray');
```



```
In [489]: plt.subplots(figsize=(10,10))
plt.imshow(mask_cells + mask_nuclei, cmap = 'gray');
```



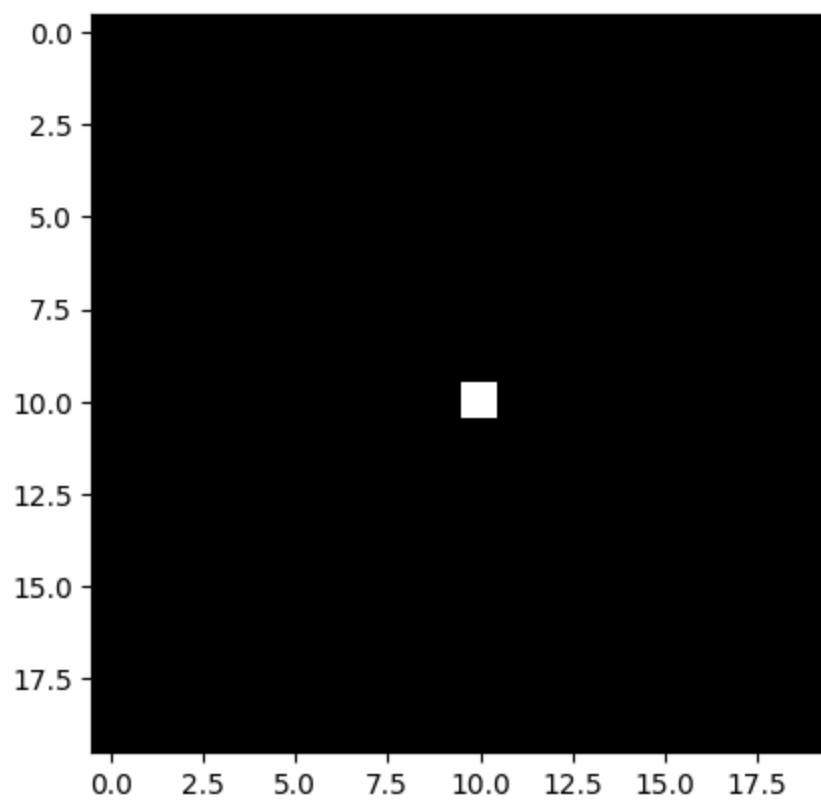
```
In [490]: combine_or = np.logical_or(mask_cells, mask_nuclei)
plt.imshow(combine_or, cmap = 'gray');
```



```
In [491]: # from IPython.display import HTML, display  
# HTML(filename='https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif')
```

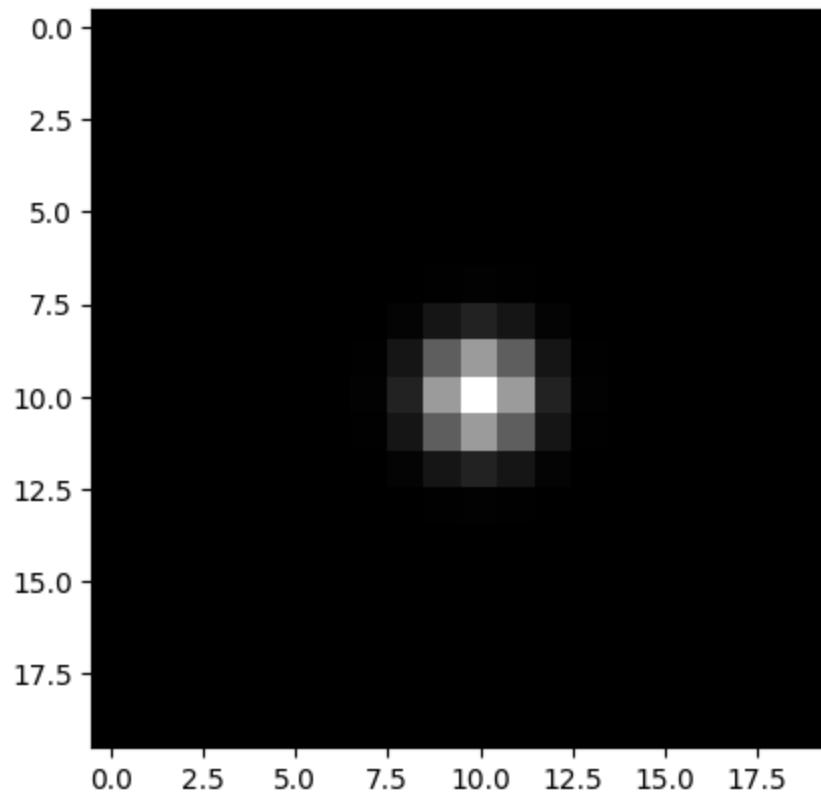
```
In [492]: import numpy as np  
import matplotlib.pyplot as plt  
import skimage  
import skimage.io  
import skimage.morphology
```

```
In [493]: single_dot = np.zeros((20,20))  
single_dot[10,10] = 1  
plt.imshow(single_dot, cmap = 'gray');
```

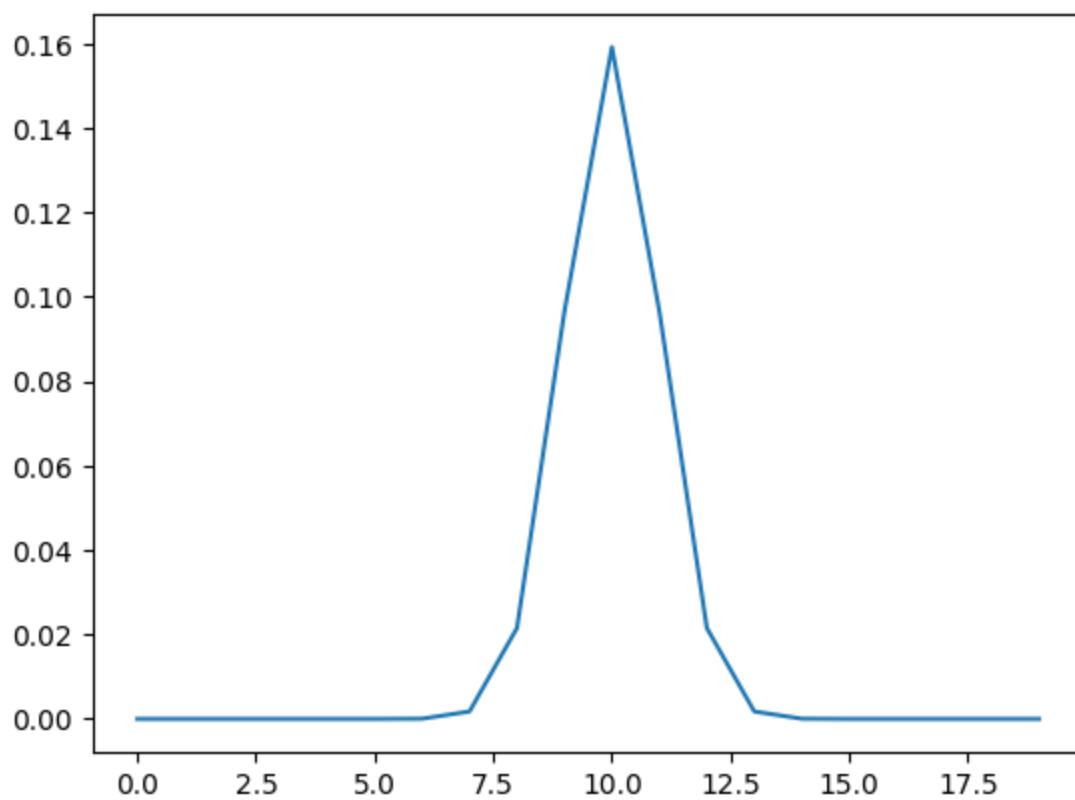


```
In [494...]: filtered = skimage.filters.gaussian(single_dot)
```

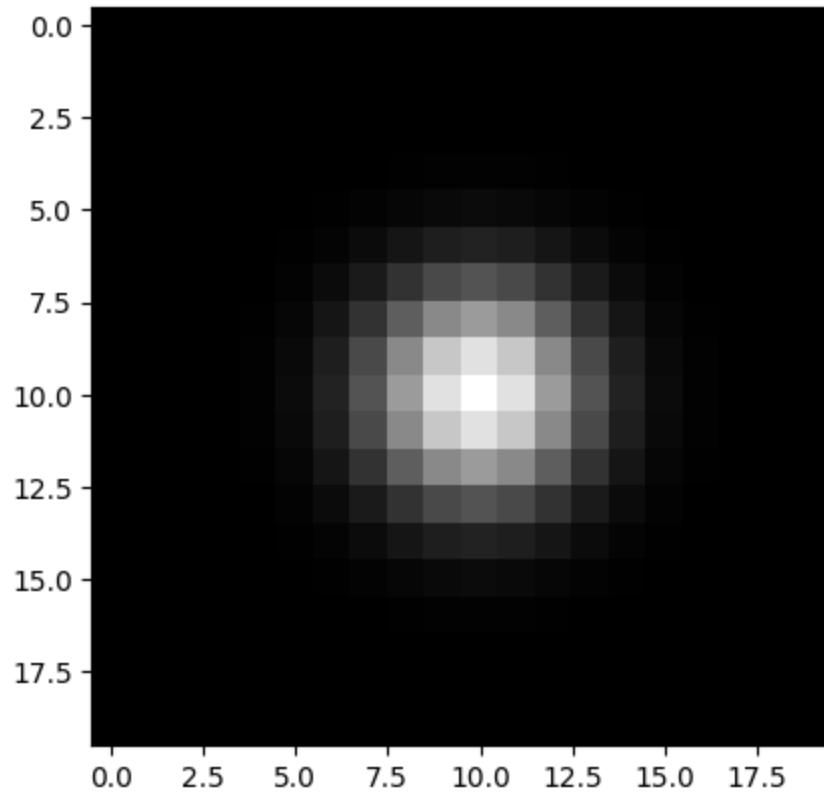
```
In [495...]: plt.imshow(filtered, cmap = 'gray');
```



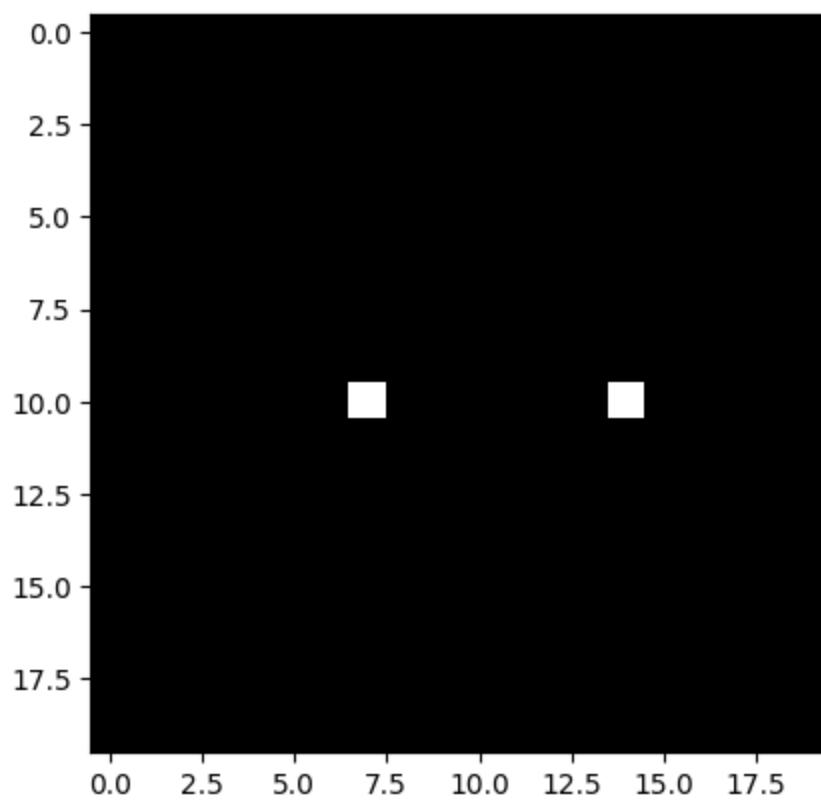
```
In [496...]: plt.plot(filtered[10, :]);
```



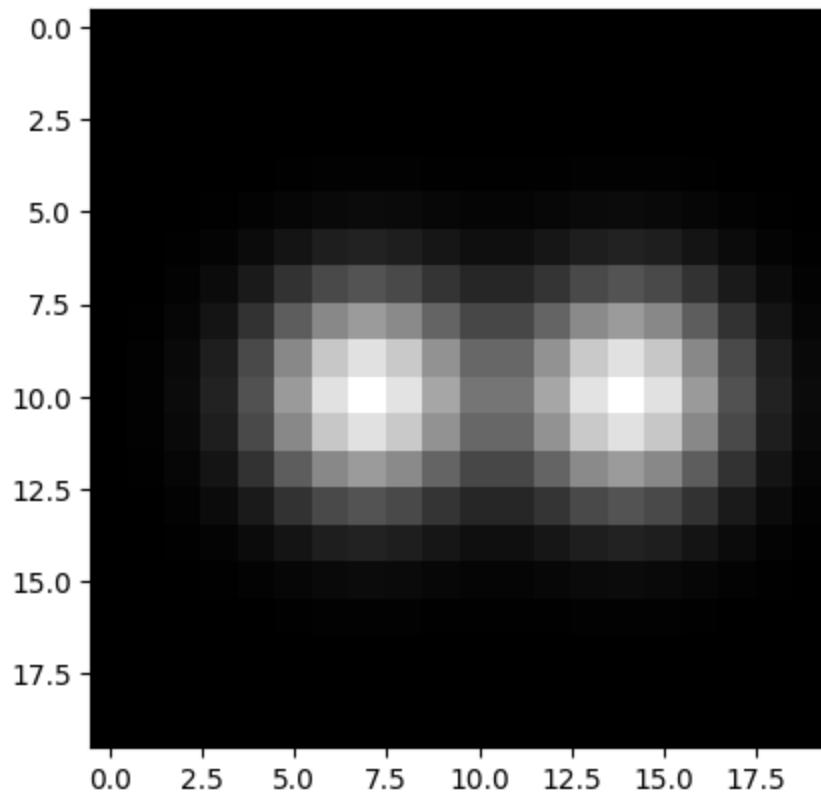
```
In [497]: filtered = skimage.filters.gaussian(single_dot, sigma=2)
plt.imshow(filtered, cmap = 'gray');
```



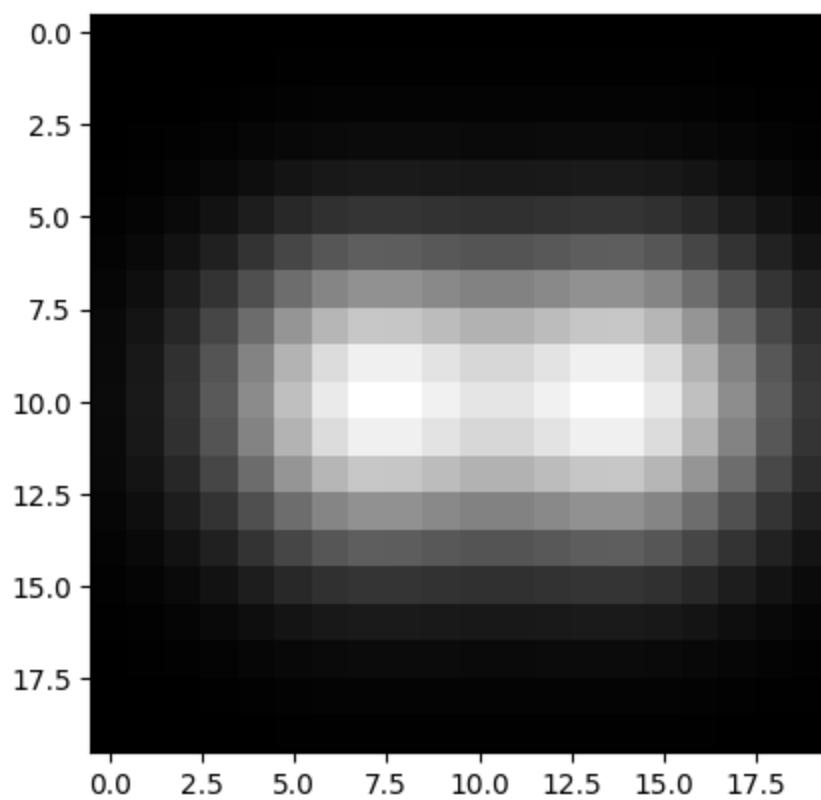
```
In [498]: double_dot = np.zeros((20,20))
double_dot[10,7] = 1
double_dot[10,14] = 1
plt.imshow(double_dot, cmap = 'gray');
```



```
In [499]: filtered = skimage.filters.gaussian(double_dot, sigma=2)  
plt.imshow(filtered, cmap = 'gray');
```

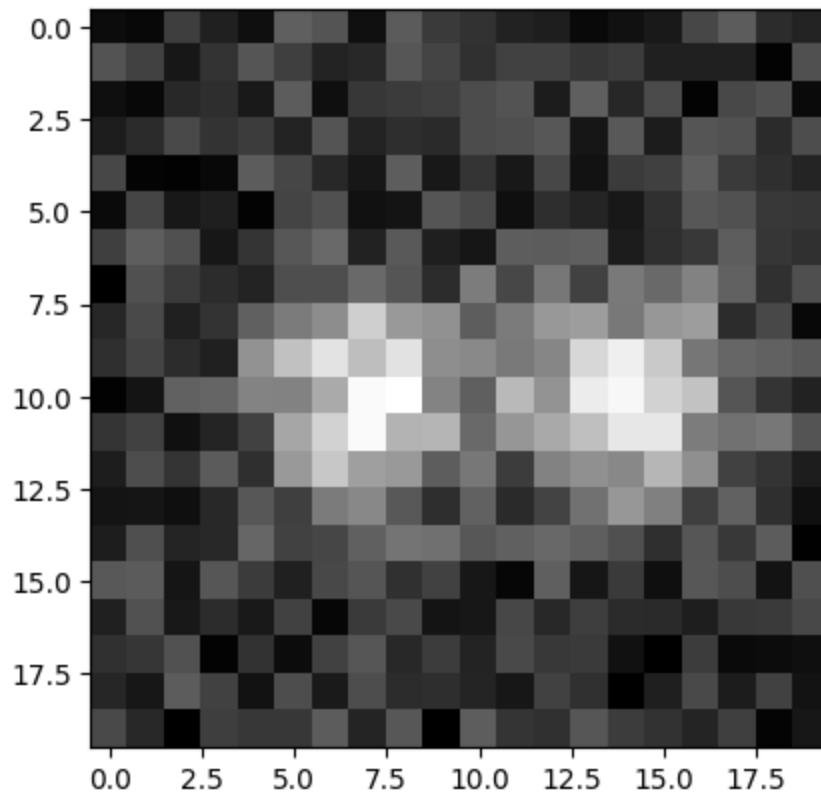


```
In [500]: filtered2 = skimage.filters.gaussian(filtered, sigma=2)  
plt.imshow(filtered2, cmap = 'gray');
```

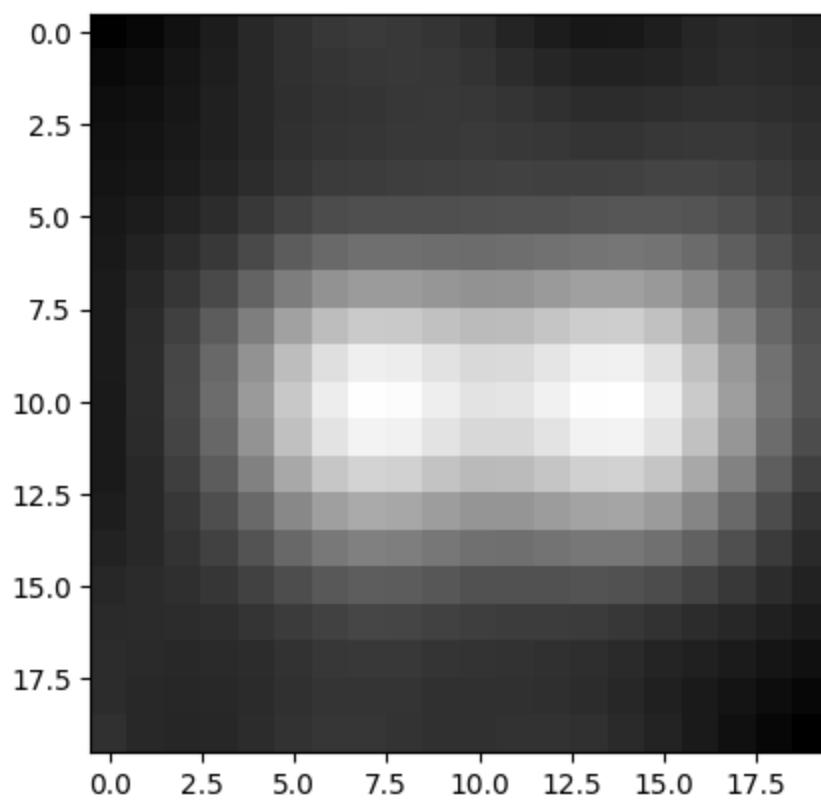


```
In [501]: noisy = filtered + 0.02*np.random.rand(20,20)
```

```
In [502]: plt.imshow(noisy, cmap = 'gray');
```

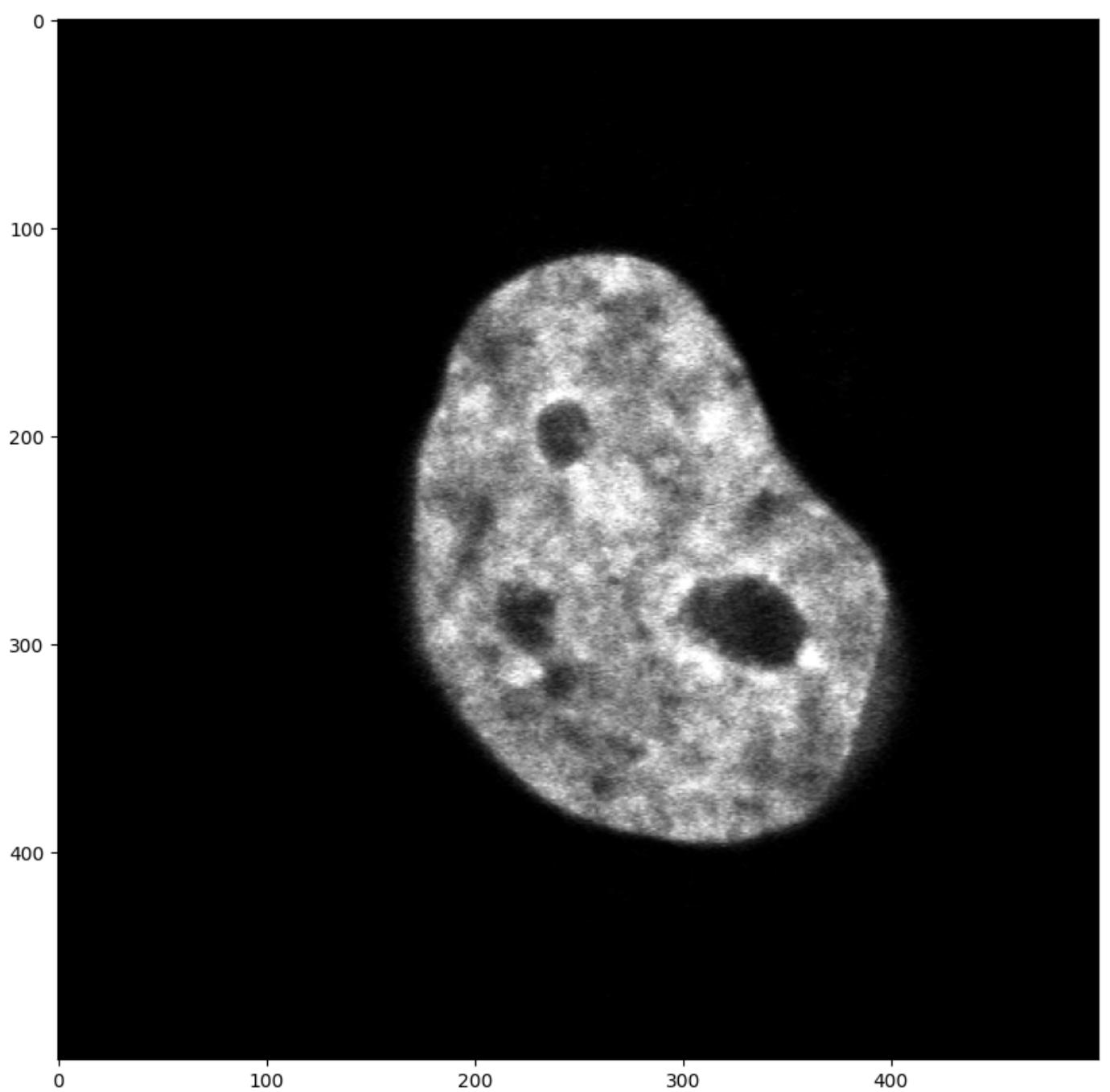


```
In [503]: noise_filtered = skimage.filters.gaussian(noisy, sigma=2)
plt.imshow(noise_filtered, cmap = 'gray');
```



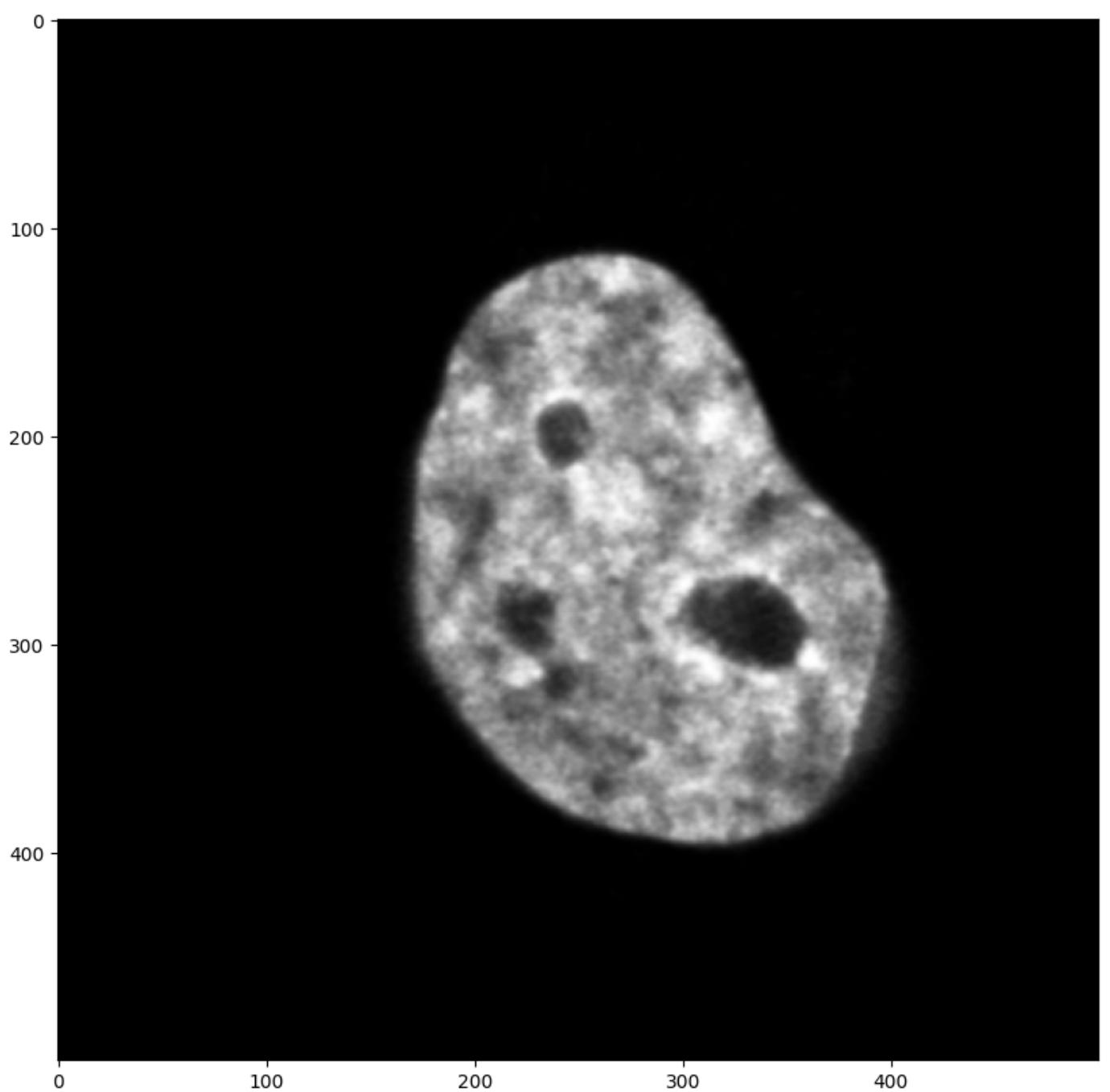
```
In [504]: #image_stack = skimage.io.imread('images/46658_784_B12_1.tif')
image_stack = skimage.io.imread('https://github.com/guiwitz/PyImageCourse_beginner/raw/m
image_nuclei = image_stack[1250:1750, 300:800, 2]
```

```
In [505]: plt.subplots(figsize=(10,10))
plt.imshow(image_nuclei, cmap = 'gray');
```



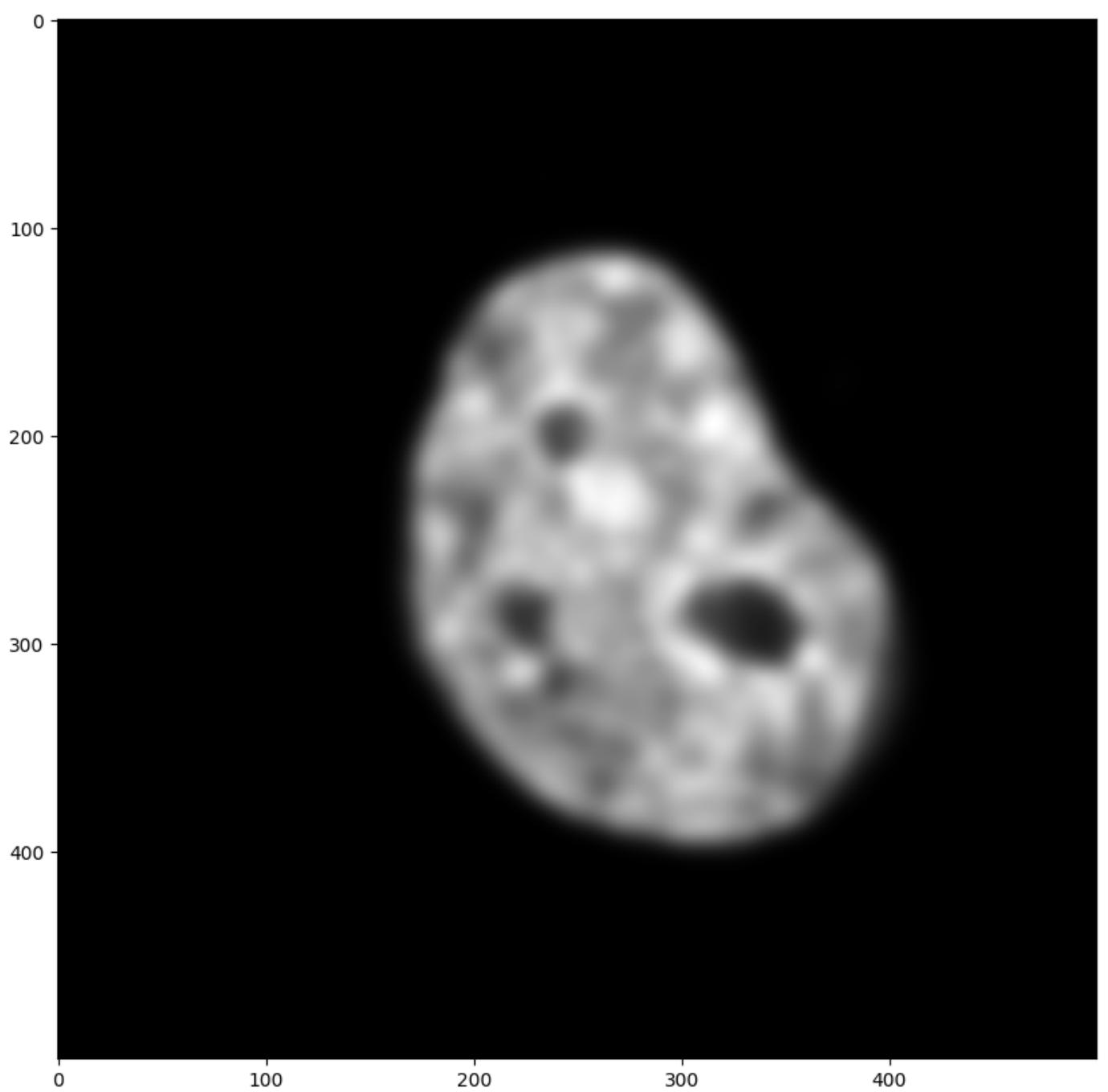
```
In [506]: filtered_image = skimage.filters.gaussian(image_nuclei)
```

```
In [507]: plt.subplots(figsize=(10,10))
plt.imshow(filtered_image, cmap = 'gray');
```



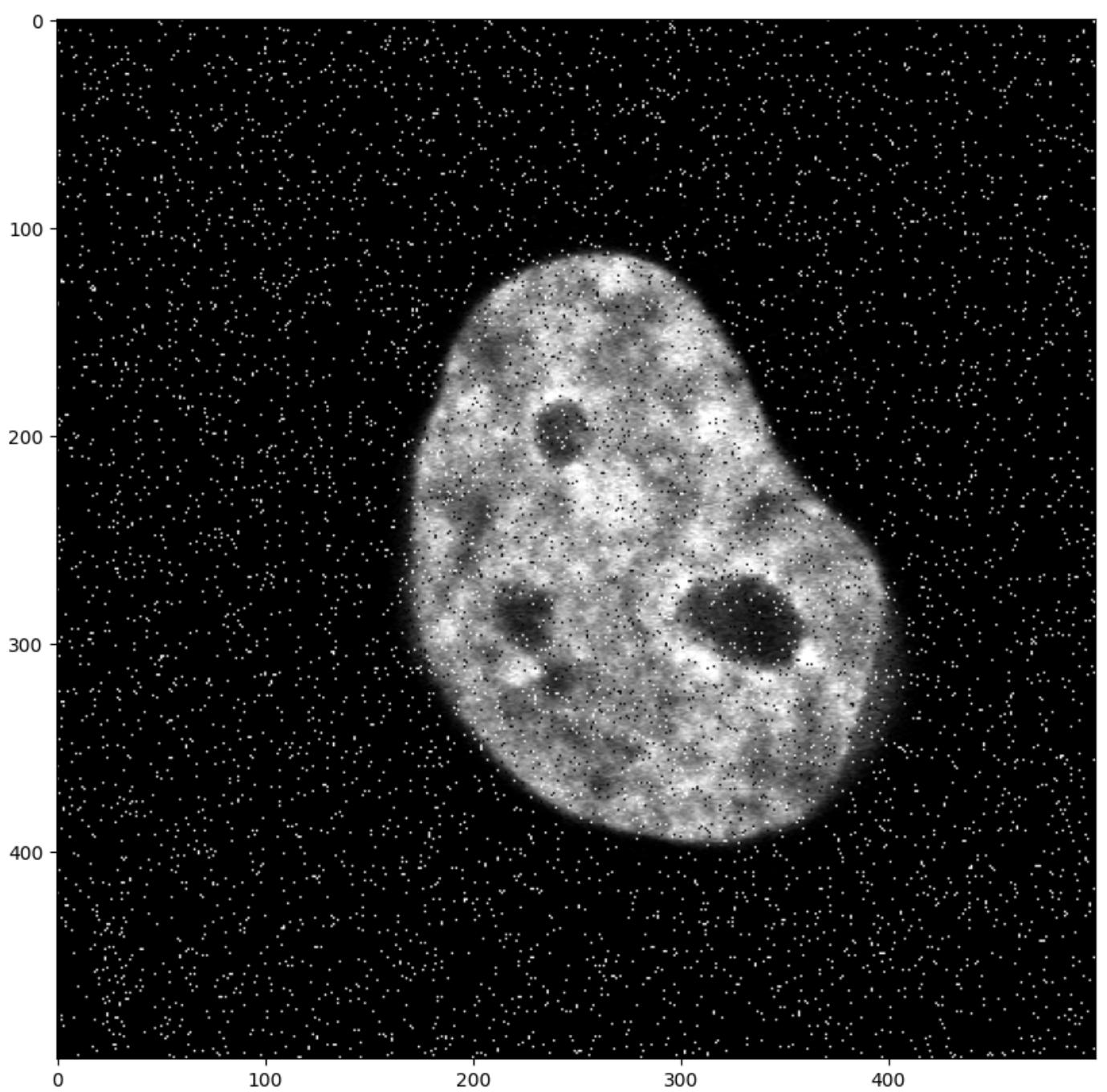
```
In [508]: filtered_image = skimage.filters.gaussian(image_nuclei, sigma = 5)
```

```
In [509]: plt.subplots(figsize=(10,10))
plt.imshow(filtered_image, cmap = 'gray');
```



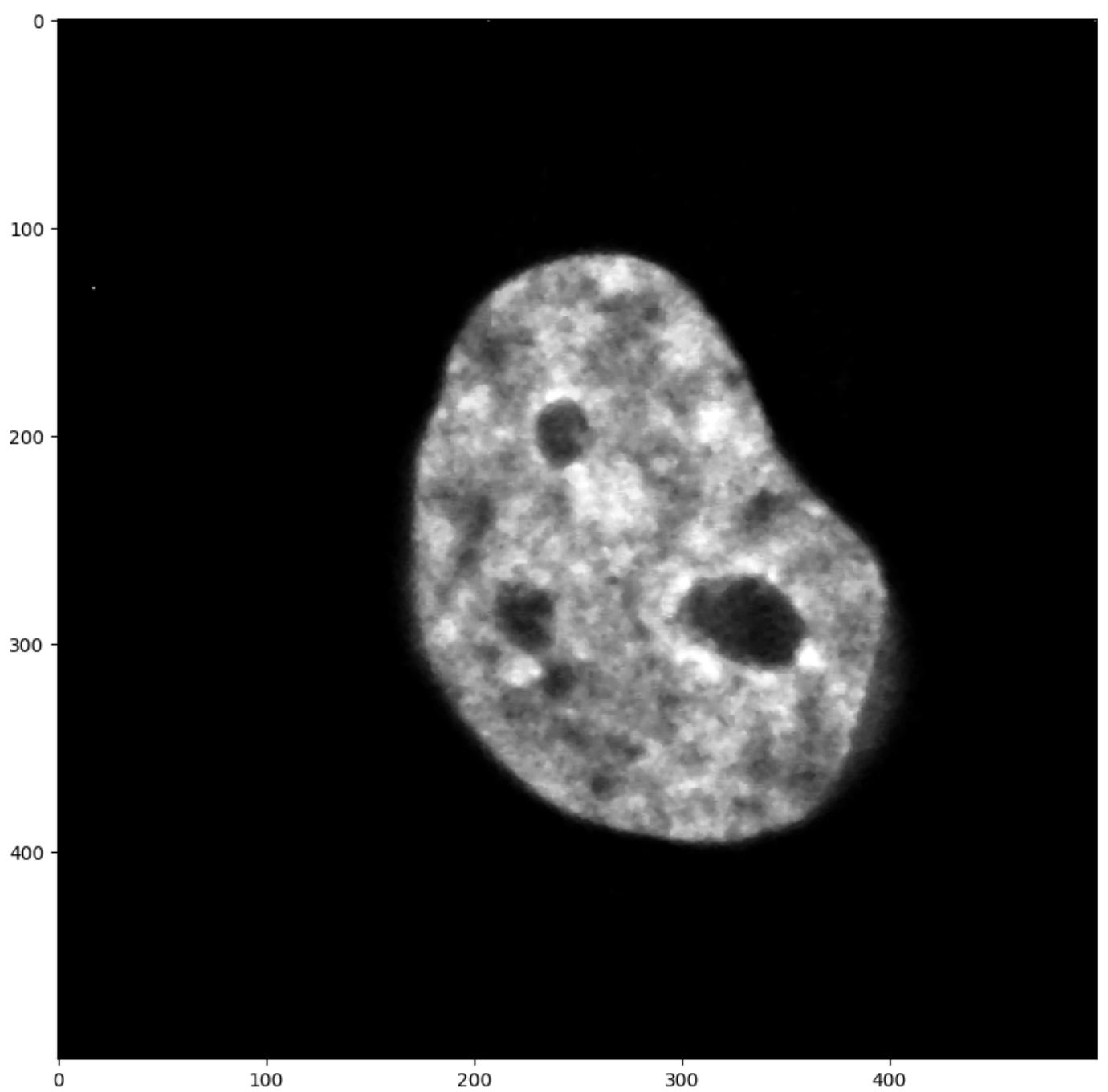
```
In [510]: image_noisy = skimage.util.random_noise(image_nuclei, mode='s&p')
```

```
In [511]: plt.subplots(figsize=(10,10))
plt.imshow(image_noisy, cmap = 'gray');
```

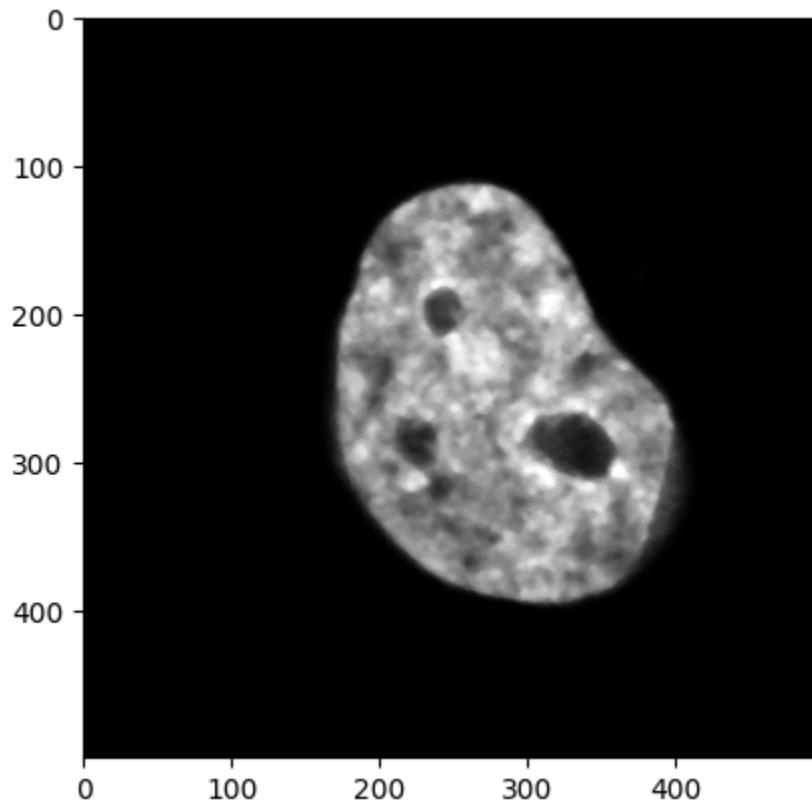


```
In [512]: filtered_median = skimage.filters.median(image_noisy)

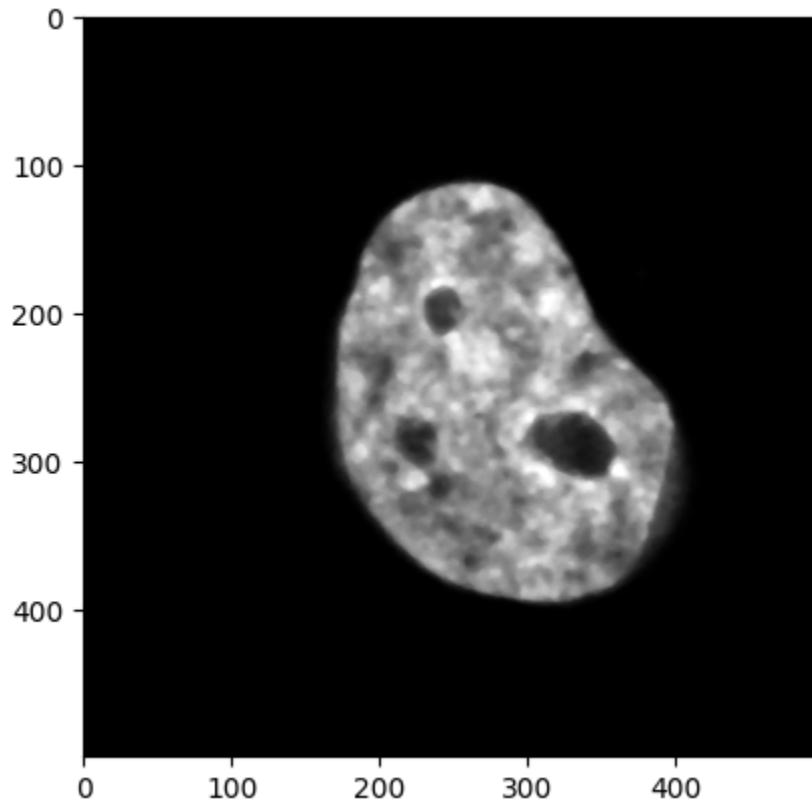
plt.subplots(figsize=(10,10))
plt.imshow(filtered_median, cmap = 'gray');
```



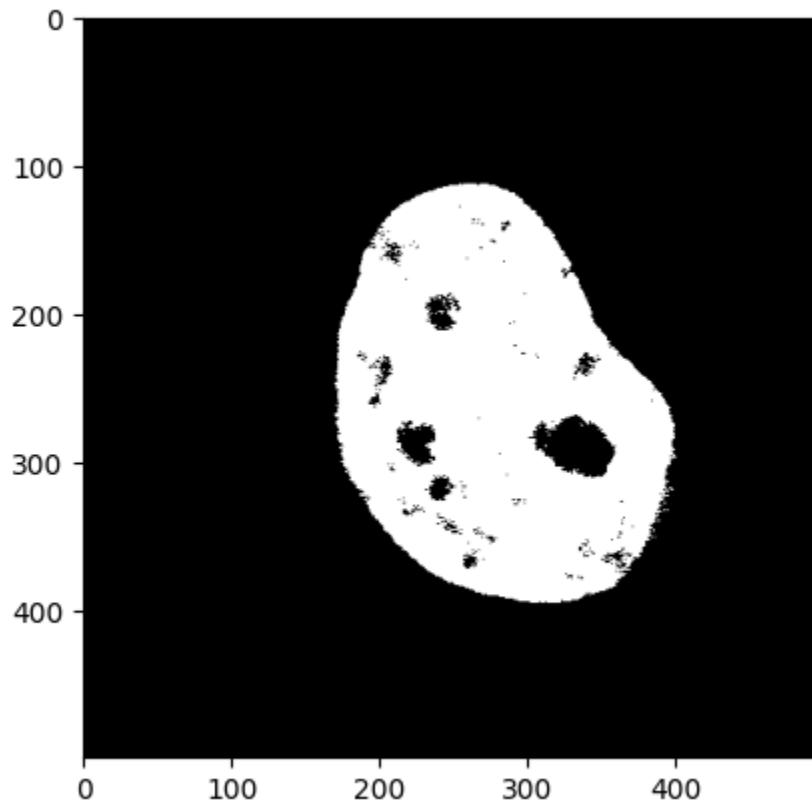
```
In [513]: footprint = np.ones((5,5))
filtered_median = skimage.filters.median(image_noisy, footprint=footprint)
plt.imshow(filtered_median, cmap = 'gray');
```



```
In [514]: footprint = skimage.morphology.disk(3)
filtered_median = skimage.filters.median(image_noisy, footprint=footprint)
plt.imshow(filtered_median, cmap = 'gray');
```



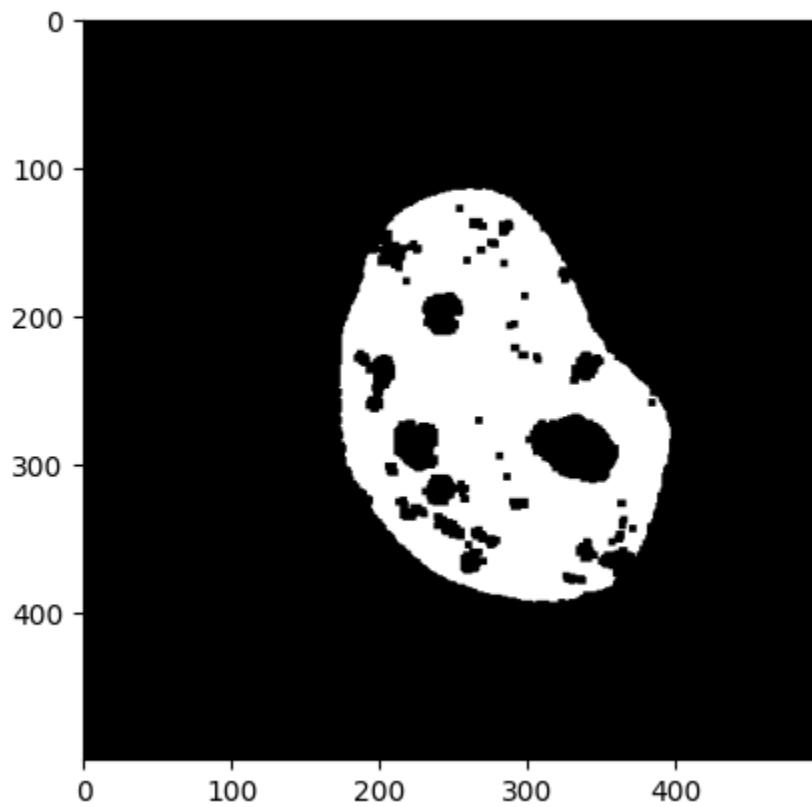
```
In [515]: mask = image_nuclei > skimage.filters.threshold_otsu(image_nuclei)
plt.imshow(mask, cmap = 'gray');
```



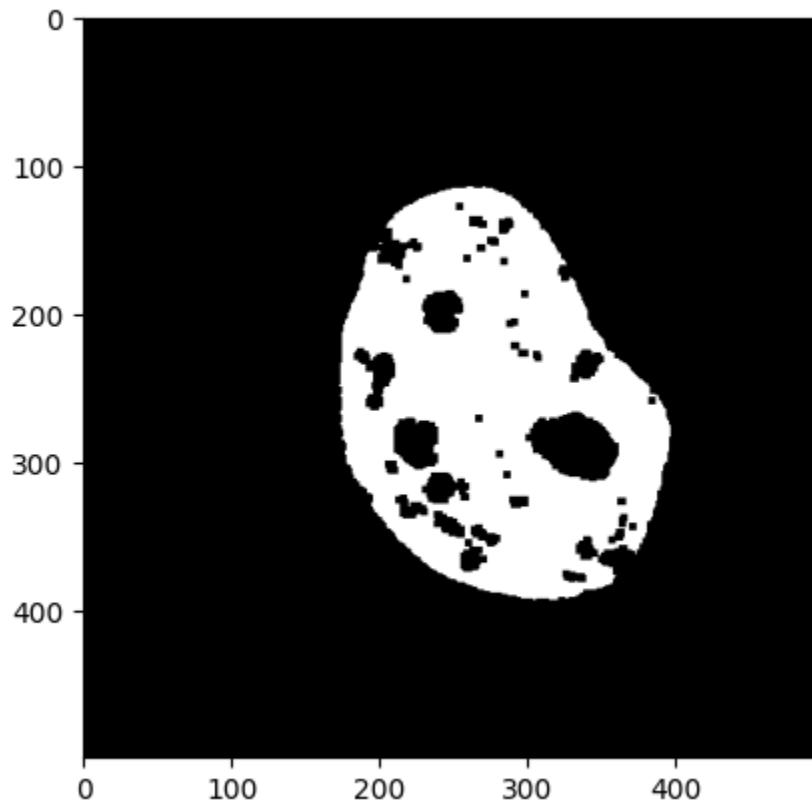
```
In [516]: influence_region = np.ones((5,5))
```

```
In [517]: eroded = skimage.morphology.binary_erosion(mask, footprint=influence_region)
```

```
In [518]: plt.imshow(eroded, cmap = 'gray');
```



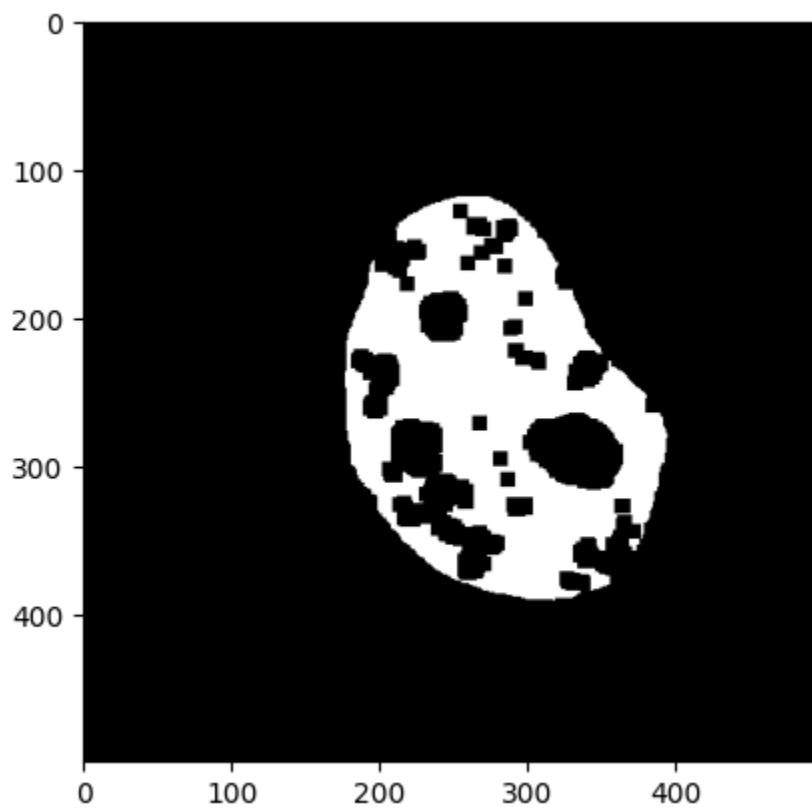
```
In [519]: plt.imshow(eroded, cmap = 'gray');
```



```
In [520]: influence_region = np.ones((10,10))

eroded = skimage.morphology.binary_erosion(mask, footprint=influence_region)

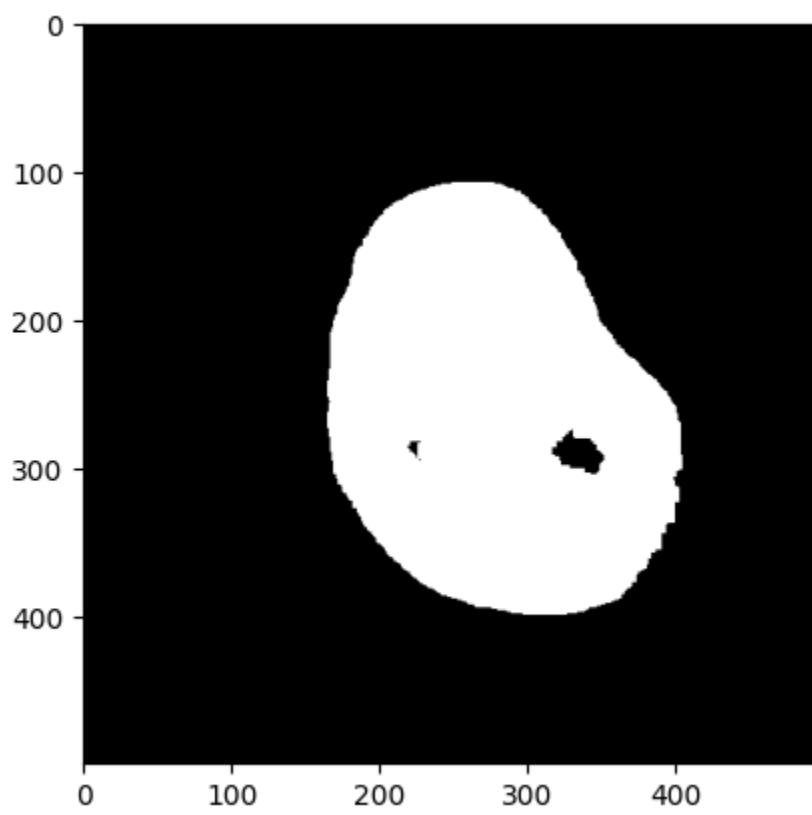
plt.imshow(eroded, cmap = 'gray');
```



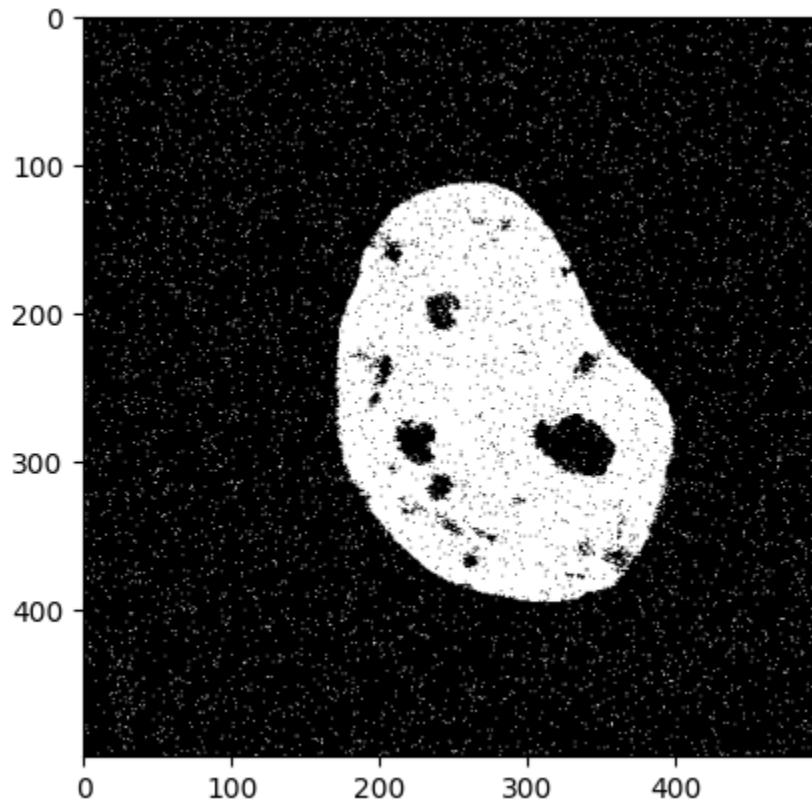
```
In [521]: influence_region = np.ones((10,10))

dilated = skimage.morphology.binary_dilation(mask, footprint=influence_region)

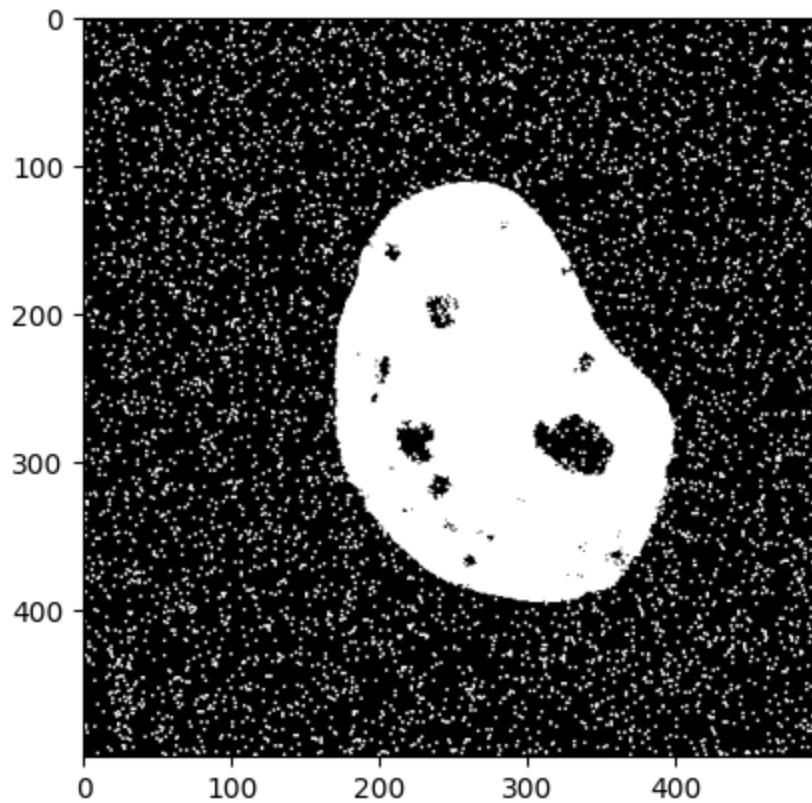
plt.imshow(dilated, cmap = 'gray');
```



```
In [522]: mask = image_noisy > skimage.filters.threshold_otsu(image_noisy)  
plt.imshow(mask, cmap = 'gray');
```



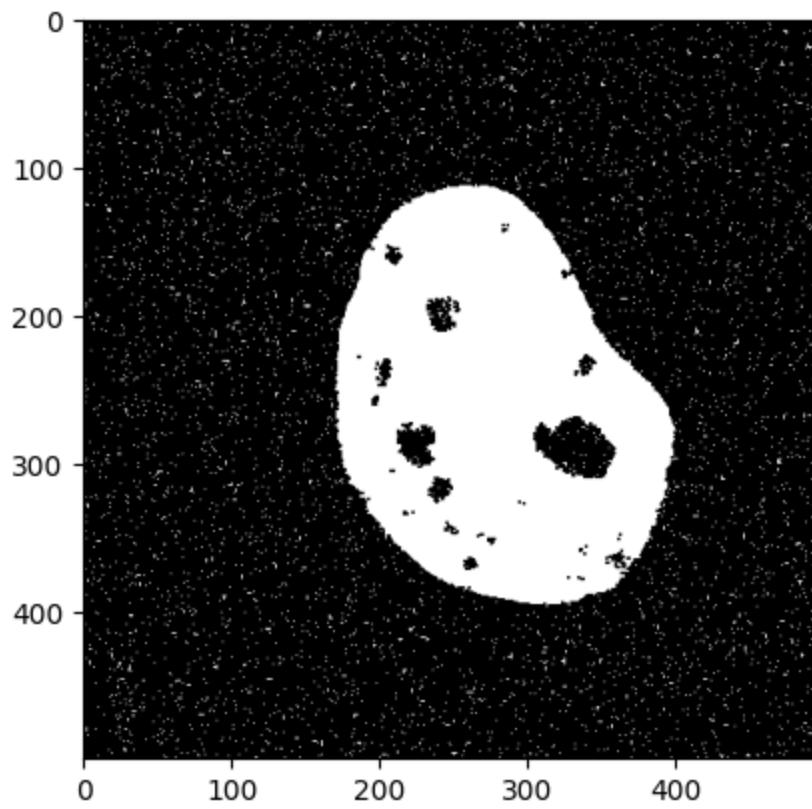
```
In [523]: influence_region = np.ones((2,2))  
  
step1 = skimage.morphology.binary_dilation(mask, footprint=influence_region)  
  
plt.imshow(step1, cmap = 'gray');
```



```
In [524]: influence_region = np.ones((2,2))

step2 = skimage.morphology.binary_erosion(step1, footprint=influence_region)

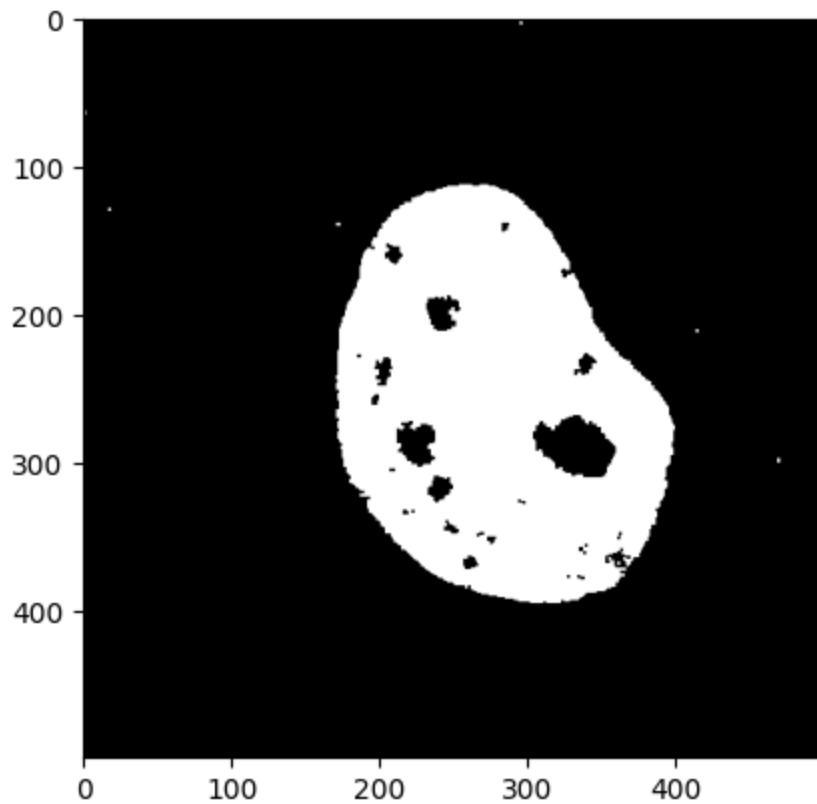
plt.imshow(step2, cmap = 'gray');
```



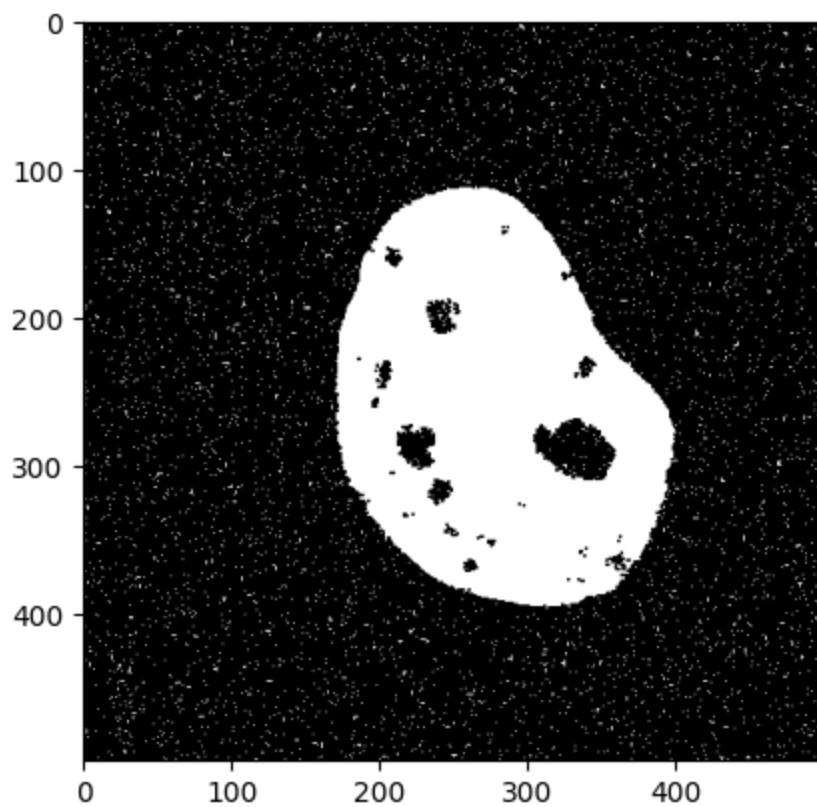
```
In [525]: influence_region = np.ones((2,2))

step3 = skimage.morphology.binary_erosion(step2, footprint=influence_region)
step4 = skimage.morphology.binary_dilation(step3, footprint=influence_region)
```

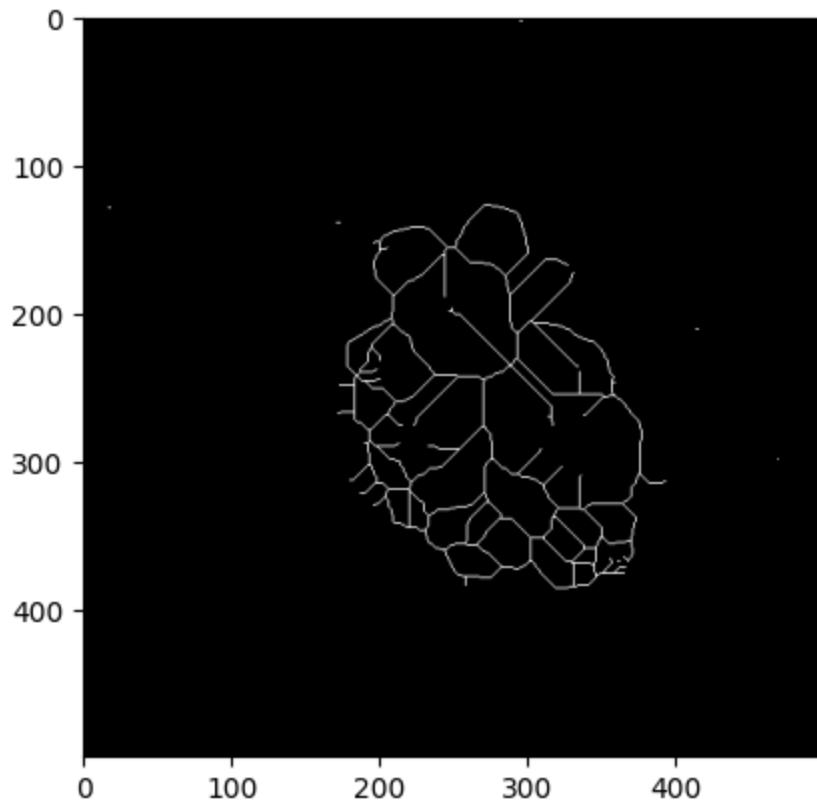
```
plt.imshow(step4, cmap = 'gray');
```



```
In [526]: plt.imshow(skimage.morphology.binary_closing(mask, footprint=influence_region), cmap='gr
```



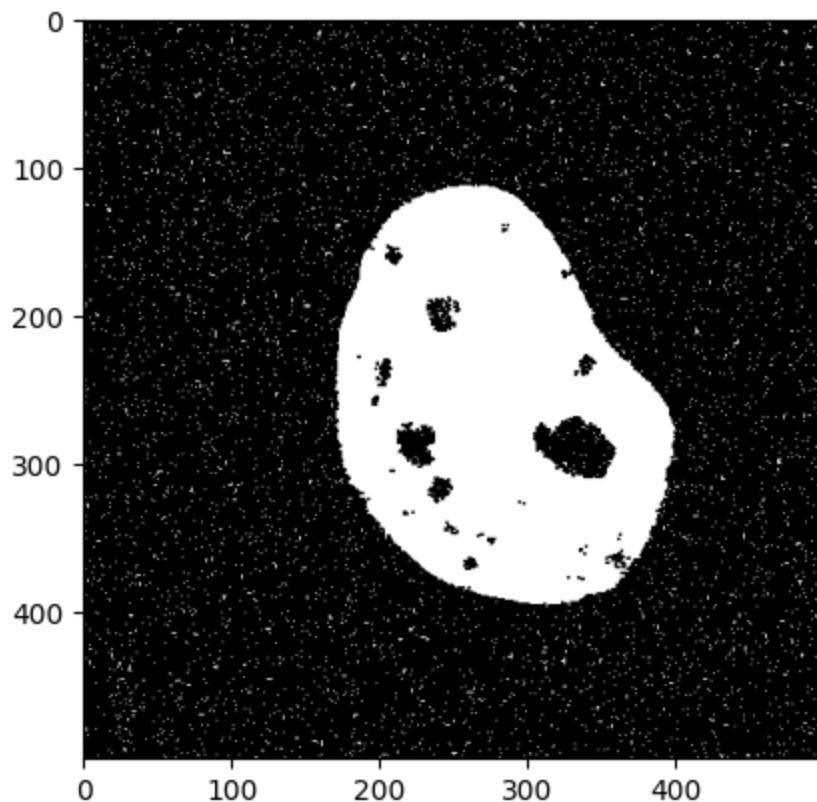
```
In [527]: skeleton = skimage.morphology.skeletonize(step4)  
plt.imshow(skeleton, cmap = 'gray');
```



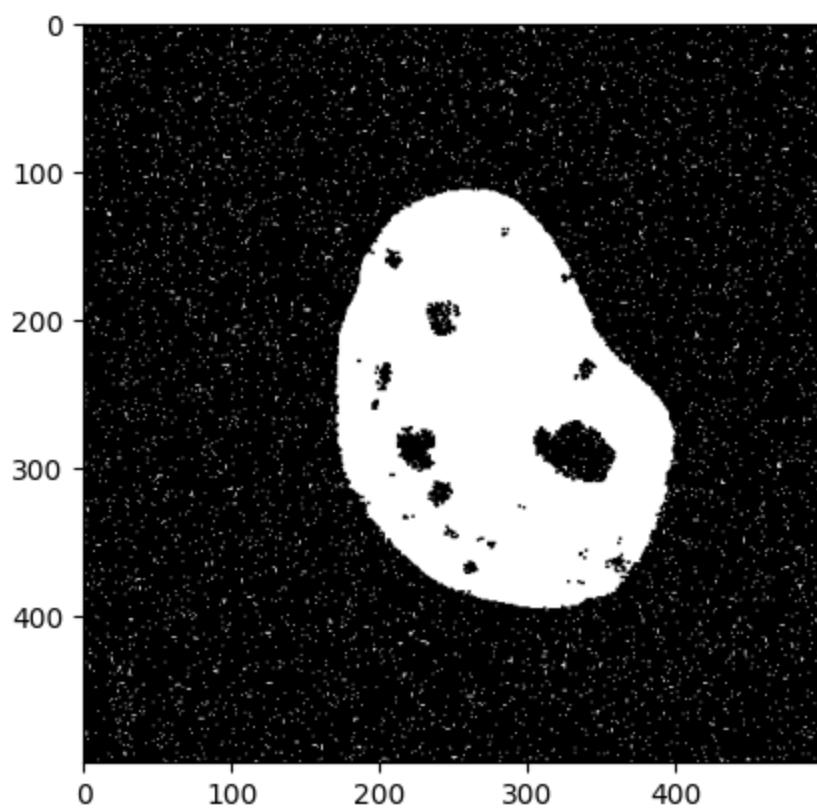
```
In [528]: import scipy.ndimage as ndi
```

```
In [529]: image_closed = skimage.morphology.binary_closing(mask, footprint=influence_region)
```

```
In [530]: plt.imshow(image_closed, cmap='gray');
```

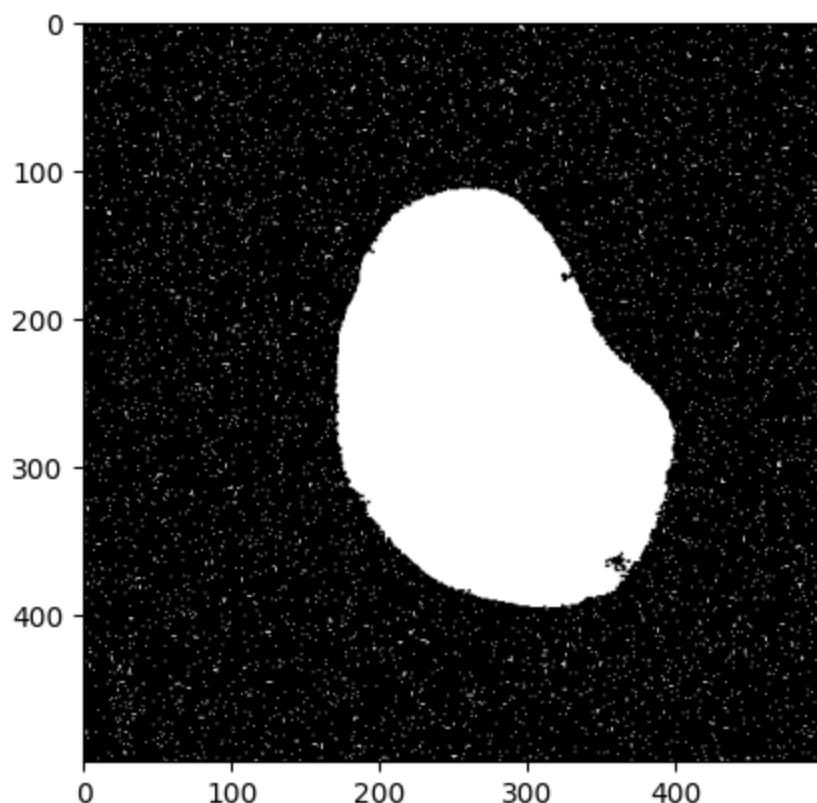


```
In [531]: plt.imshow(image_closed, cmap='gray');
```



```
In [532]: image_fill = ndi.binary_fill_holes(image_closed, skimage.morphology.disk(5))
```

```
In [533]: plt.imshow(image_fill, cmap='gray');
```



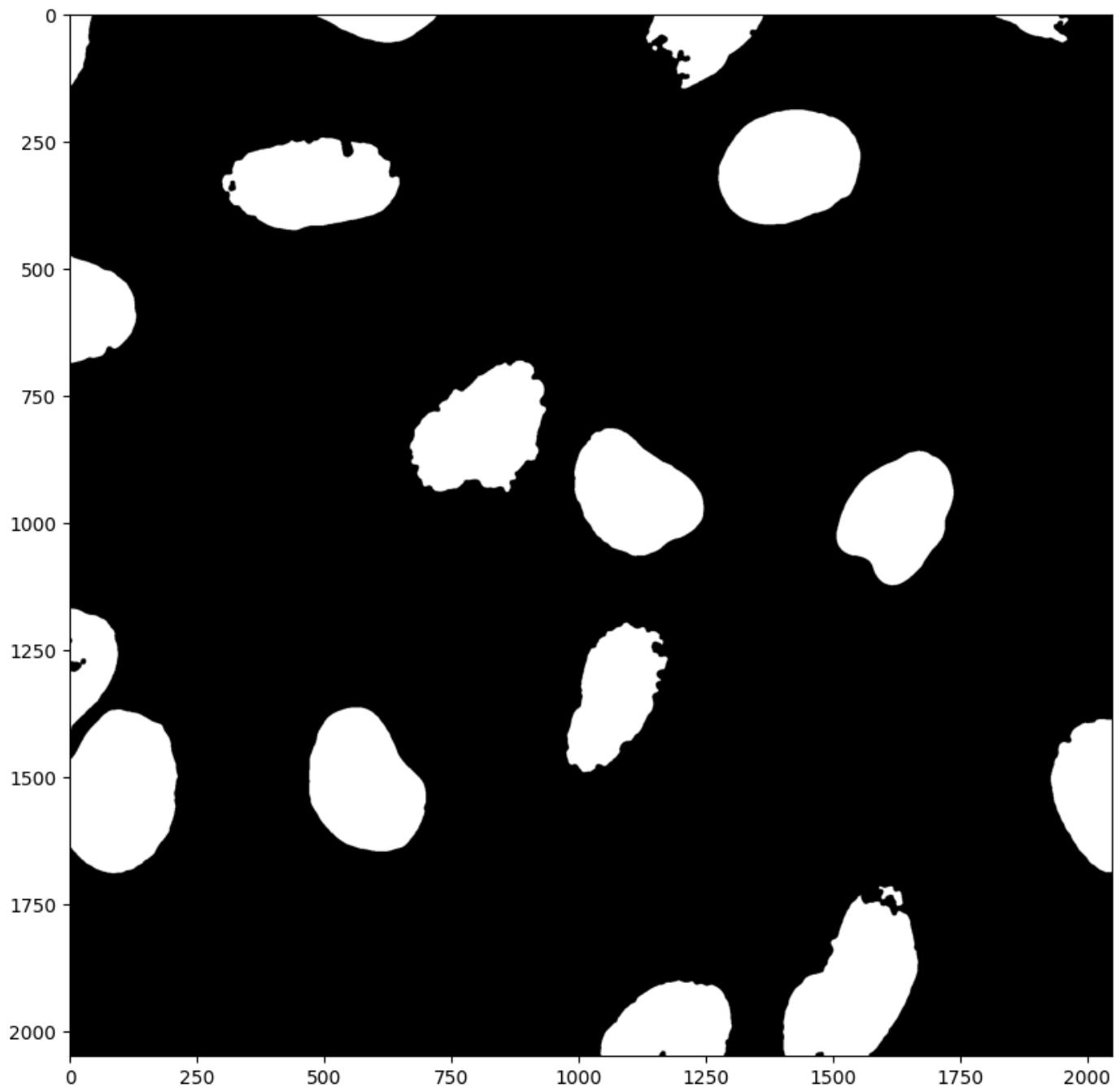
```
In [534]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import skimage
import skimage.io
import skimage.morphology
import scipy.ndimage as ndi
```

```
In [535...]: #image_stack = skimage.io.imread('images/46658_784_B12_1.tif')
image_stack = skimage.io.imread('https://github.com/guiwitz/PyImageCourse_beginner/raw/m
image_nuclei = image_stack[:, :, 2] #blue channel in RGB
image_signal = image_stack[:, :, 1] #green channel in RGB

# filter image
image_nuclei = skimage.filters.median(image_nuclei, skimage.morphology.disk(5))

# create mask and clean-up
mask_nuclei = image_nuclei > skimage.filters.threshold_otsu(image_nuclei)
mask_nuclei = skimage.morphology.binary_closing(mask_nuclei, footprint=skimage.morpholog
mask_nuclei = ndi.binary_fill_holes(mask_nuclei, skimage.morphology.disk(5))
```

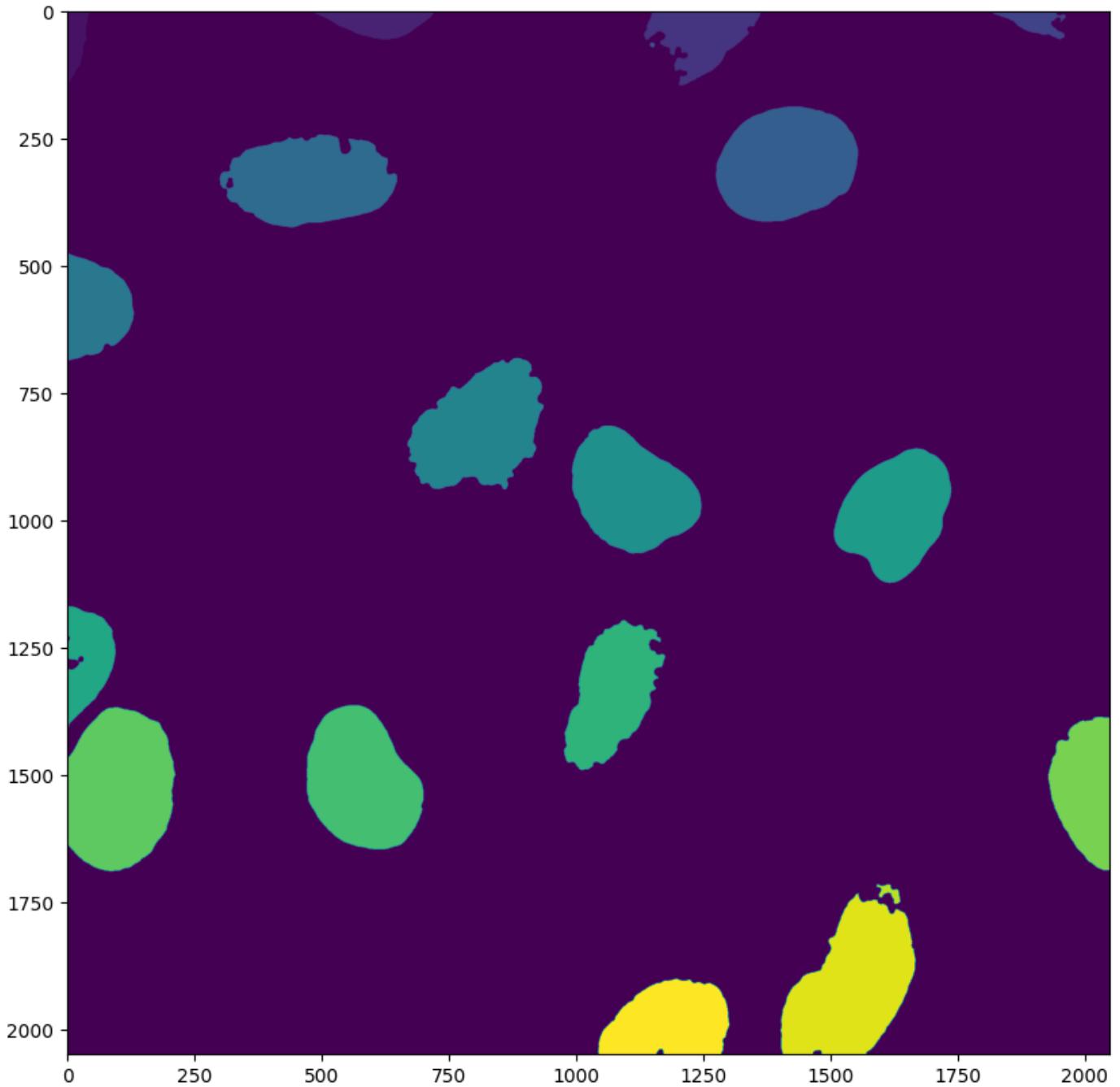
```
In [536...]: plt.subplots(figsize=(10,10))
plt.imshow(mask_nuclei, cmap = 'gray');
```



```
In [537...]: my_labels = skimage.morphology.label(mask_nuclei)
```

```
In [538...]: plt.subplots(figsize=(10,10))
```

```
plt.imshow(my_labels);
```



```
In [539]: my_regions = skimage.measure.regionprops_table(my_labels, properties=('label','area'))
```

```
In [540]: my_regions
```

```
Out[540]: {'label': array([ 1,  2,  3,  4,  5,  6,  7,  8,  9, 10, 11, 12, 13, 14, 15, 16, 17,
   18, 19, 20]),
 'area': array([4.2210e+03, 8.3860e+03, 1.8258e+04, 4.0430e+03, 7.3000e+01,
  4.9056e+04, 4.5671e+04, 2.0537e+04, 4.6853e+04, 4.3277e+04,
  4.0768e+04, 1.5090e+04, 3.5404e+04, 4.7642e+04, 5.4978e+04,
  2.6774e+04, 4.0000e+00, 8.1200e+02, 5.4298e+04, 2.9638e+04])}
```

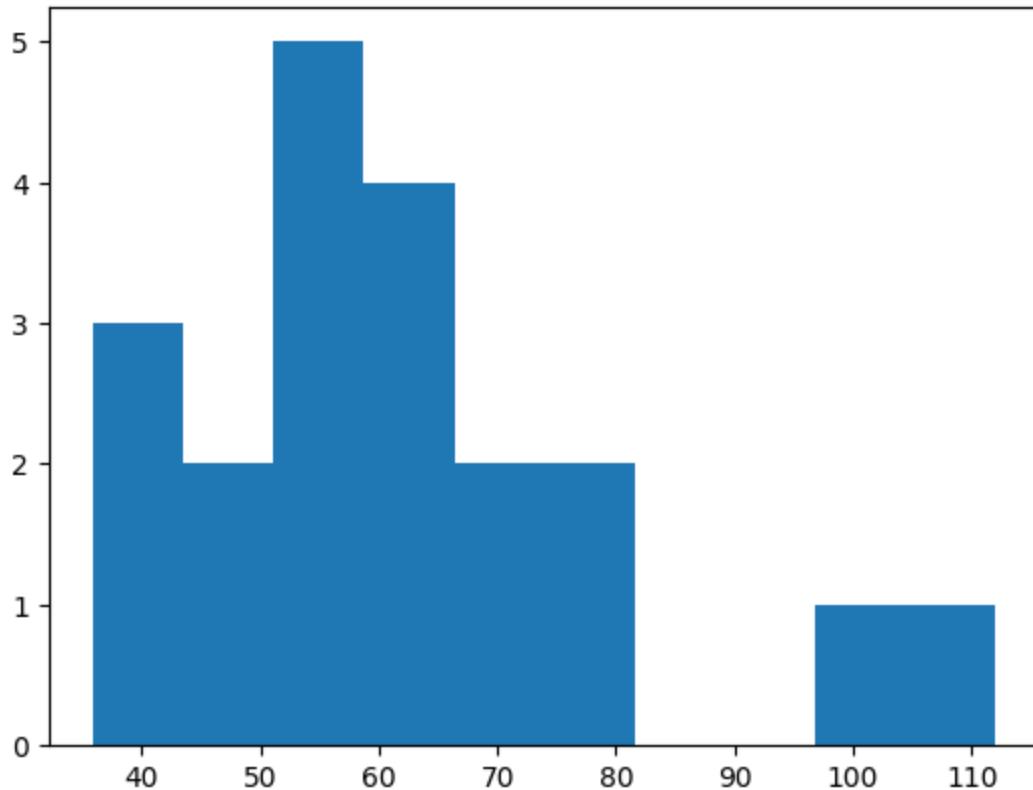
```
In [541]: my_regions = skimage.measure.regionprops_table(
    my_labels, intensity_image=image_signal, properties=('label','area','mean_intensity'))
```

```
In [542]: my_regions
```

```
Out[542]: {'label': array([ 1,  2,  3,  4,  5,  6,  7,  8,  9, 10, 11, 12, 13, 14, 15, 16, 17,
   18, 19, 20]),
 'area': array([4.2210e+03, 8.3860e+03, 1.8258e+04, 4.0430e+03, 7.3000e+01,
  4.9056e+04, 4.5671e+04, 2.0537e+04, 4.6853e+04, 4.3277e+04,
```

```
4.0768e+04, 1.5090e+04, 3.5404e+04, 4.7642e+04, 5.4978e+04,  
2.6774e+04, 4.0000e+00, 8.1200e+02, 5.4298e+04, 2.9638e+04]),  
'mean_intensity': array([ 79.26510306, 65.99773432, 70.26109103, 63.02671284,  
47.43835616, 53.71450995, 53.8070986 , 70.45391245,  
66.13772864, 41.4125517 , 58.67503925, 44.19814447,  
74.77155124, 41.70190168, 35.9041071 , 53.07787406,  
112.          , 102.9864532 , 56.11020664, 66.28379108])}
```

```
In [543... plt.hist(my_regions['mean_intensity']);
```



```
In [544... my_regions['area']
```

```
Out[544]: array([4.2210e+03, 8.3860e+03, 1.8258e+04, 4.0430e+03, 7.3000e+01,  
4.9056e+04, 4.5671e+04, 2.0537e+04, 4.6853e+04, 4.3277e+04,  
4.0768e+04, 1.5090e+04, 3.5404e+04, 4.7642e+04, 5.4978e+04,  
2.6774e+04, 4.0000e+00, 8.1200e+02, 5.4298e+04, 2.9638e+04])
```

```
In [545... selected = my_regions['area'] > 100  
selected
```

```
Out[545]: array([ True,  True,  True,  True, False,  True,  True,  True,  
 True,  True,  True,  True,  True,  True,  False,  True,  
 True,  True])
```

```
In [546... my_regions['mean_intensity'][selected]
```

```
Out[546]: array([ 79.26510306, 65.99773432, 70.26109103, 63.02671284,  
53.71450995, 53.8070986 , 70.45391245, 66.13772864,  
41.4125517 , 58.67503925, 44.19814447, 74.77155124,  
41.70190168, 35.9041071 , 53.07787406, 102.9864532 ,  
56.11020664, 66.28379108])
```

```
In [547... import pandas as pd
```

```
In [548... np.random.seed(42)  
my_array = np.random.randint(0,100, (3,5))  
my_array
```

```
Out[548]: array([[51, 92, 14, 71, 60],
```

```
[20, 82, 86, 74, 74],  
[87, 99, 23, 2, 21]])
```

```
In [549... pd.DataFrame(my_array)
```

```
Out[549]:
```

	0	1	2	3	4
0	51	92	14	71	60
1	20	82	86	74	74
2	87	99	23	2	21

```
In [550... pd.DataFrame(my_array)
```

```
Out[550]:
```

	0	1	2	3	4
0	51	92	14	71	60
1	20	82	86	74	74
2	87	99	23	2	21

```
In [551... my_df = pd.DataFrame(my_array, columns=['a', 'b', 'c', 'd', 'e'])  
my_df
```

```
Out[551]:
```

	a	b	c	d	e
0	51	92	14	71	60
1	20	82	86	74	74
2	87	99	23	2	21

```
In [552... my_df['c']
```

```
Out[552]:
```

0	14
1	86
2	23

Name: c, dtype: int32

```
In [553... my_df['c'] < 50
```

```
Out[553]:
```

0	True
1	False
2	True

Name: c, dtype: bool

```
In [554... my_df[my_df['c'] < 50]
```

```
Out[554]:
```

	a	b	c	d	e
0	51	92	14	71	60
2	87	99	23	2	21

```
In [555... my_regions
```

```
Out[555]:
```

```
{'label': array([ 1,  2,  3,  4,  5,  6,  7,  8,  9, 10, 11, 12, 13, 14, 15, 16, 17,  
                 18, 19, 20]),  
 'area': array([4.2210e+03, 8.3860e+03, 1.8258e+04, 4.0430e+03, 7.3000e+01,  
                4.9056e+04, 4.5671e+04, 2.0537e+04, 4.6853e+04, 4.3277e+04,  
                4.0768e+04, 1.5090e+04, 3.5404e+04, 4.7642e+04, 5.4978e+04,  
                2.6774e+04, 4.0000e+00, 8.1200e+02, 5.4298e+04, 2.9638e+04]),  
 'mean_intensity': array([ 79.26510306,  65.99773432,  70.26109103,  63.02671284,  
                           47.43835616,  53.71450995,  53.8070986 ,  70.45391245,
```

```
66.13772864, 41.4125517 , 58.67503925, 44.19814447,  
74.77155124, 41.70190168, 35.9041071 , 53.07787406,  
112.          , 102.9864532 , 56.11020664, 66.28379108])}
```

```
In [556]: my_regions_df = pd.DataFrame(my_regions)  
my_regions_df
```

```
Out[556]:   label    area  mean_intensity  
0      1  4221.0     79.265103  
1      2  8386.0     65.997734  
2      3  18258.0    70.261091  
3      4  4043.0     63.026713  
4      5     73.0     47.438356  
5      6  49056.0    53.714510  
6      7  45671.0    53.807099  
7      8  20537.0    70.453912  
8      9  46853.0    66.137729  
9     10  43277.0    41.412552  
10    11  40768.0    58.675039  
11    12  15090.0    44.198144  
12    13  35404.0    74.771551  
13    14  47642.0    41.701902  
14    15  54978.0    35.904107  
15    16  26774.0    53.077874  
16    17      4.0    112.000000  
17    18    812.0    102.986453  
18    19  54298.0    56.110207  
19    20  29638.0    66.283791
```

```
In [557]: my_regions_df[my_regions_df['area'] > 100]
```

```
Out[557]:   label    area  mean_intensity  
0      1  4221.0     79.265103  
1      2  8386.0     65.997734  
2      3  18258.0    70.261091  
3      4  4043.0     63.026713  
5      6  49056.0    53.714510  
6      7  45671.0    53.807099  
7      8  20537.0    70.453912  
8      9  46853.0    66.137729  
9     10  43277.0    41.412552  
10    11  40768.0    58.675039  
11    12  15090.0    44.198144  
12    13  35404.0    74.771551
```

```
13    14  47642.0      41.701902
14    15  54978.0      35.904107
15    16  26774.0      53.077874
17    18   812.0       102.986453
18    19  54298.0      56.110207
19    20  29638.0      66.283791
```

In [558...]

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import skimage
import skimage.io
import skimage.morphology
from scipy import ndimage as ndi
```

In [559...]

```
def my_pipeline(image_path):
    """
    This function extracts information about nuclei found in the third channel of an image
    loaded at the given path

    Parameters
    -----
    image_path: str
        path to image

    Returns
    -----
    my_table: pandas dataframe
        dataframe with label, area, mean_intensity and extent information for each nucleus
    """

    image_stack = skimage.io.imread(image_path)

    image_nuclei = image_stack[:, :, 2] #blue channel in RGB
    image_signal = image_stack[:, :, 1] #green channel in RGB

    # filter image
    image_nuclei = skimage.filters.median(image_nuclei, skimage.morphology.disk(5))

    # create mask and clean-up
    mask_nuclei = image_nuclei > skimage.filters.threshold_otsu(image_nuclei)
    mask_nuclei = skimage.morphology.binary_closing(mask_nuclei, footprint=skimage.morphology.disk(5))
    mask_nuclei = ndi.binary_fill_holes(mask_nuclei, skimage.morphology.disk(5))

    # label image
    my_labels = skimage.morphology.label(mask_nuclei)

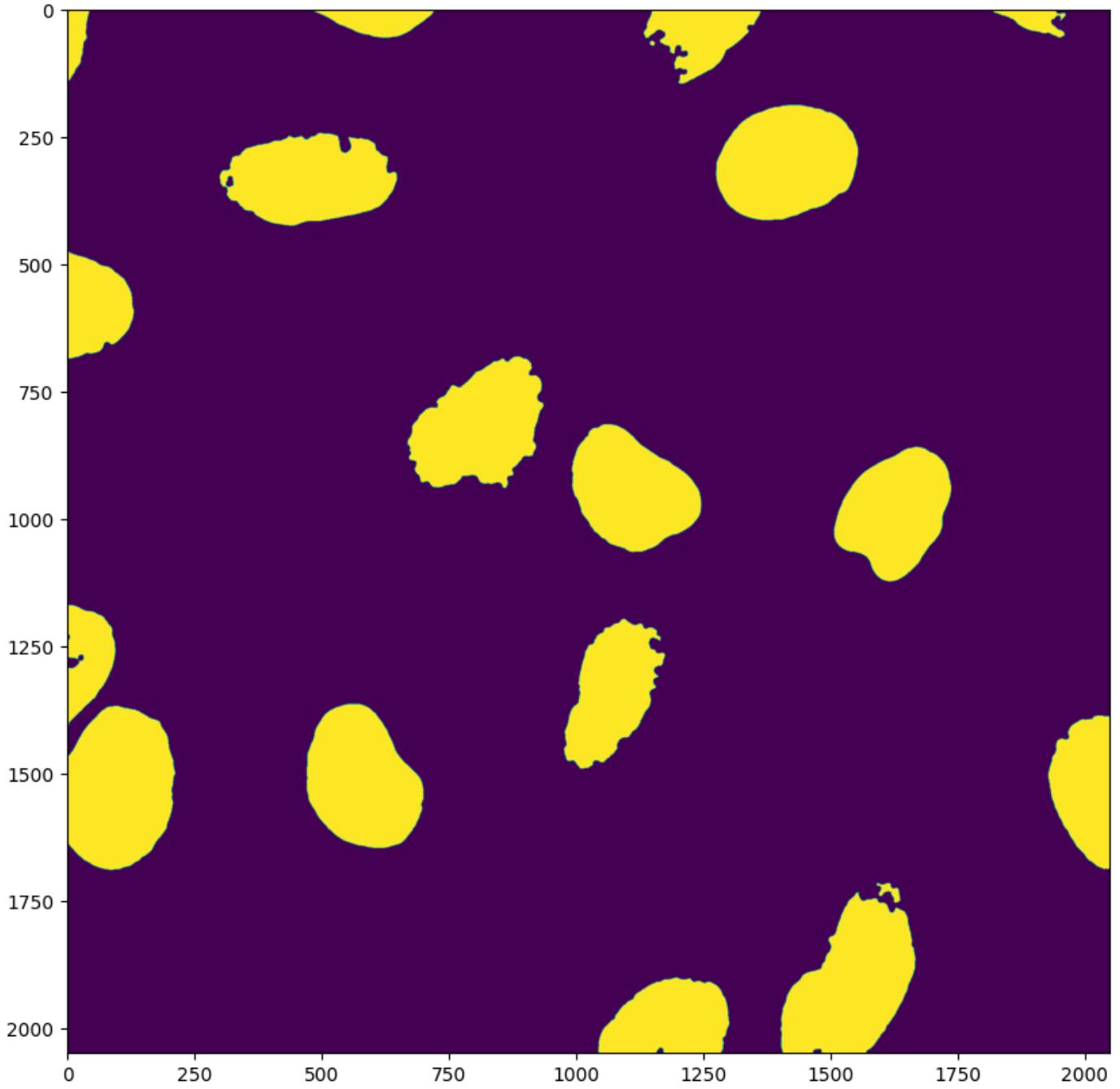
    # measure
    my_regions = skimage.measure.regionprops_table(my_labels, image_signal, properties=(

        plt.subplots(figsize=(10, 10))
        plt.imshow(mask_nuclei)
        plt.show()

    my_table = pd.DataFrame(my_regions)

    return my_table
```

```
In [560]: table = my_pipeline('https://github.com/guiwitz/PyImageCourse_beginner/raw/master/images
```



```
In [561]: table
```

	label	area	mean_intensity
0	1	4221.0	79.265103
1	2	8386.0	65.997734
2	3	18258.0	70.261091
3	4	4043.0	63.026713
4	5	73.0	47.438356
5	6	49056.0	53.714510
6	7	45671.0	53.807099
7	8	20537.0	70.453912
8	9	46853.0	66.137729
9	10	43277.0	41.412552

10	11	40768.0	58.675039
11	12	15090.0	44.198144
12	13	35404.0	74.771551
13	14	47642.0	41.701902
14	15	54978.0	35.904107
15	16	26774.0	53.077874
16	17	4.0	112.000000
17	18	812.0	102.986453
18	19	54298.0	56.110207
19	20	29638.0	66.283791

In [562]:

```
def my_pipeline(image_path, do_plotting=False):
    """
    This function extracts information about nuclei found in the third channel of an image
    loaded at the given path

    Parameters
    -----
    image_path: str
        path to image
    do_plotting: bool
        show segmentation or not

    Returns
    -----
    my_table: pandas dataframe
        dataframe with label, area, mean_intensity and extent information for each nucleus
    """

    image_stack = skimage.io.imread(image_path)

    image_nuclei = image_stack[:, :, 2] #blue channel in RGB
    image_signal = image_stack[:, :, 1] #green channel in RGB

    # filter image
    image_nuclei = skimage.filters.median(image_nuclei, skimage.morphology.disk(5))

    # create mask and clean-up
    mask_nuclei = image_nuclei > skimage.filters.threshold_otsu(image_nuclei)
    mask_nuclei = skimage.morphology.binary_closing(mask_nuclei, selem=skimage.morphology.disk(5))
    mask_nuclei = ndi.binary_fill_holes(mask_nuclei, skimage.morphology.disk(5))

    # label image
    my_labels = skimage.morphology.label(mask_nuclei)

    # measure
    my_regions = skimage.measure.regionprops_table(my_labels, image_signal, properties=(

        if do_plotting:
            plt.subplots(figsize=(10, 10))
            plt.imshow(mask_nuclei)
            plt.show()

    my_table = pd.DataFrame(my_regions)

    return my_table
```

In [565...]

```
import requests
from PIL import Image
from io import BytesIO

def my_pipeline(image_url):
    try:
        # Send a GET request to the URL
        response = requests.get(image_url)

        # Check if the request was successful
        if response.status_code == 200:
            # Read the image from the response content
            image = Image.open(BytesIO(response.content))

            # Process the image as needed
            # For example, resizing or applying filters
            # Replace the following lines with your actual image processing operations
            resized_image = image.resize((new_width, new_height))
            # processed_image = apply_filters(resized_image)

            # Store the processed image in the 'table' variable
            table = resized_image

        return table
    else:
        print("Failed to retrieve the image. Status code:", response.status_code)
        return None
    except Exception as e:
        print("Error occurred:", e)
        return None

# Call the pipeline function with the image URL
image_url = 'https://github.com/guiwitz/PyImageCourse_beginner/raw/master/images/46658_7'
table = my_pipeline(image_url)

# Check if the 'table' variable contains the processed image
if table is not None:
    print("Image processing successful.")
else:
    print("Image processing failed.")
```

Error occurred: name 'new_width' is not defined
Image processing failed.

In [566...]

```
files_to_analyze = [
    'https://github.com/guiwitz/PyImageCourse_beginner/raw/master/images/46658_784_B12_1',
    'https://github.com/guiwitz/PyImageCourse_beginner/raw/master/images/27897_273_C8_2',
]
```

In [571...]

```
from cellpose import models
```

In [572...]

```
import skimage.io
import matplotlib.pyplot as plt
```

In [574...]

```
image = skimage.io.imread('https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif')
```

In [575...]

```
image.shape
```

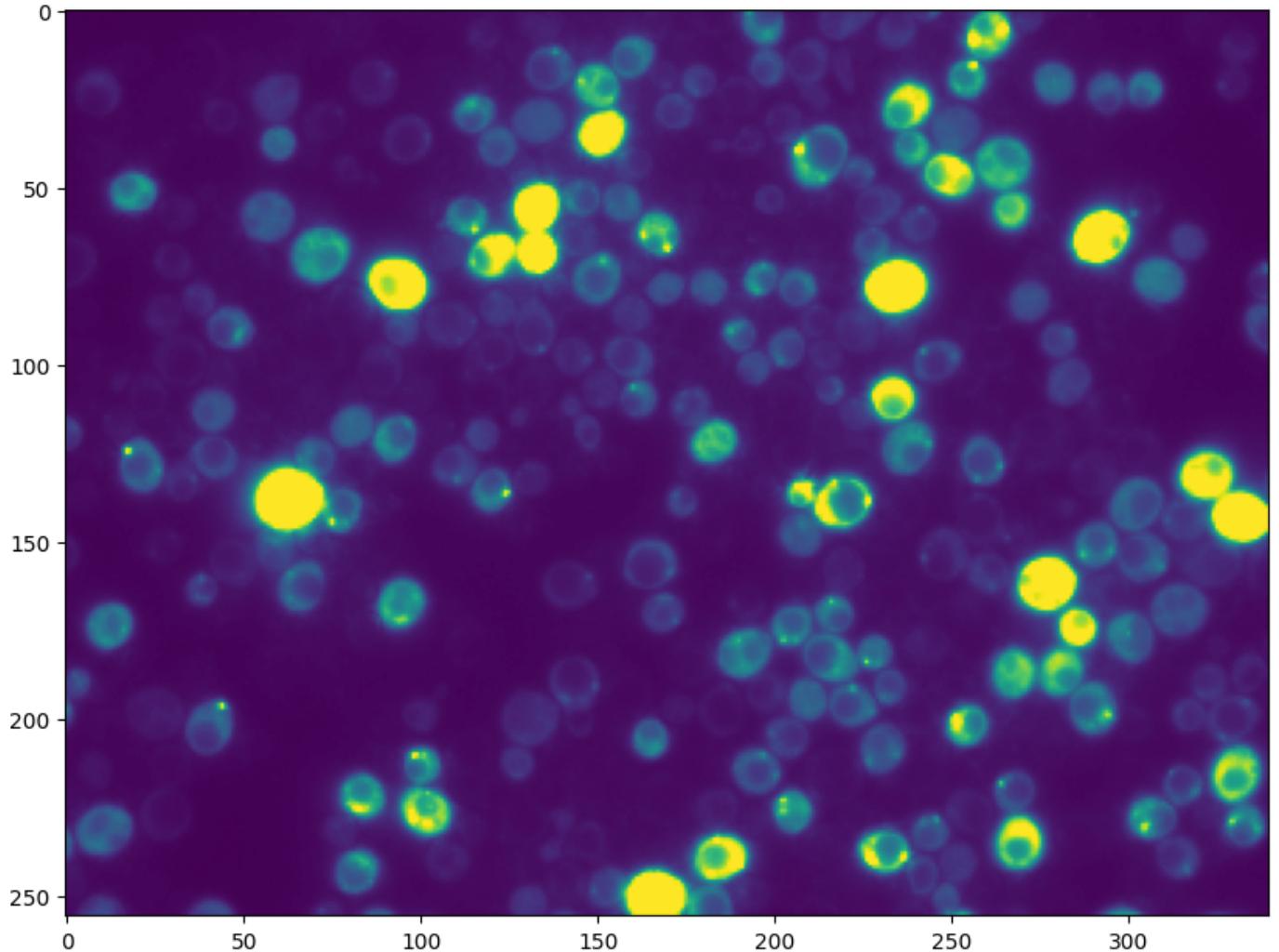
Out[575]:

```
(1024, 1360)
```

In [577...]

```
image = image[:4, :: 4]
```

```
In [578...]: fig, ax = plt.subplots(figsize=(10,10))
ax.imshow(image);
```

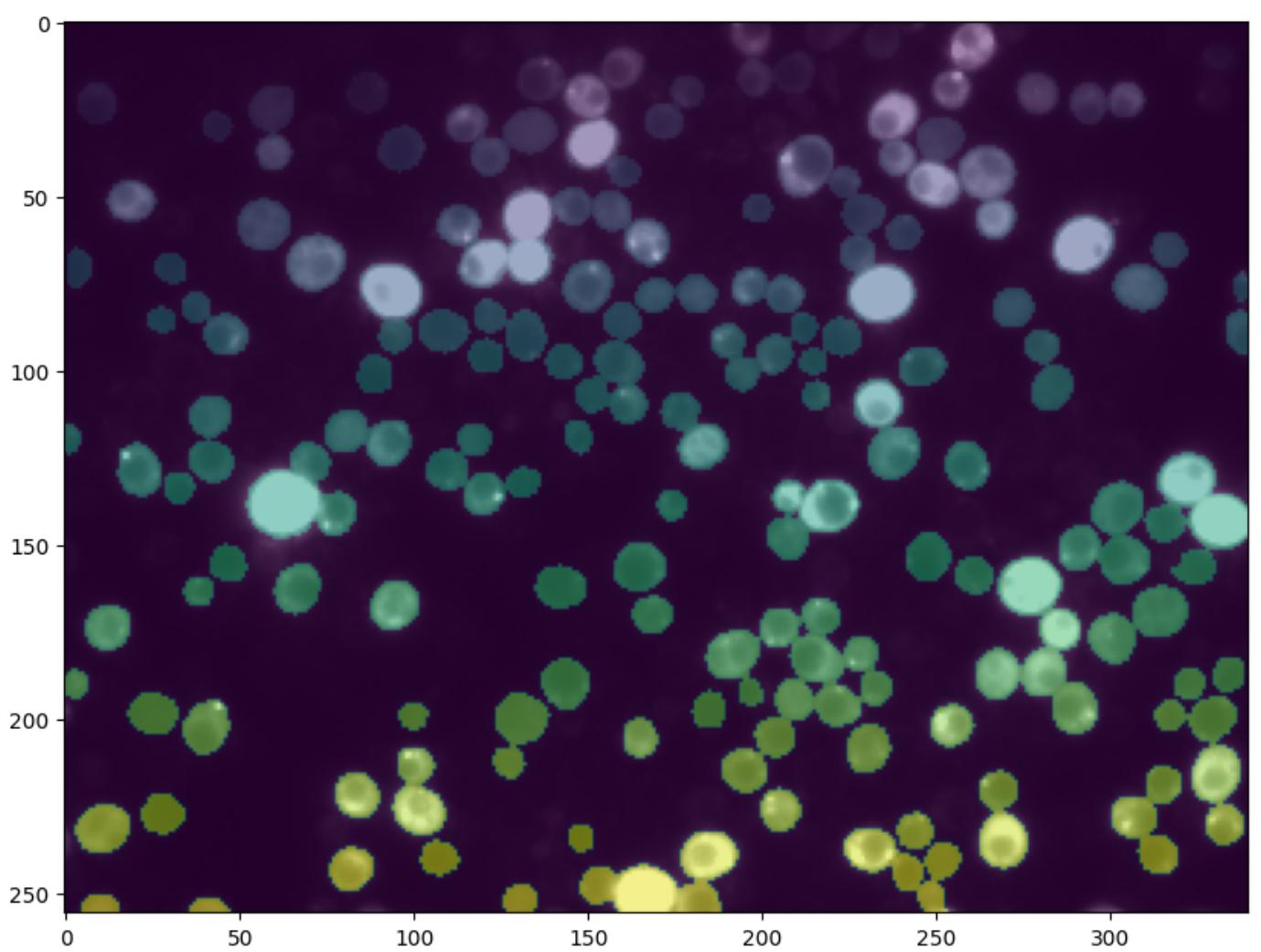


```
In [579...]: model = models.Cellpose(model_type='cyto')
```

```
100%|██████████| 25.3M/25.3M [00:25<00:00, 1.04MB/s]
100%|██████████| 5.23k/5.23k [00:00<00:00, 5.34MB/s]
```

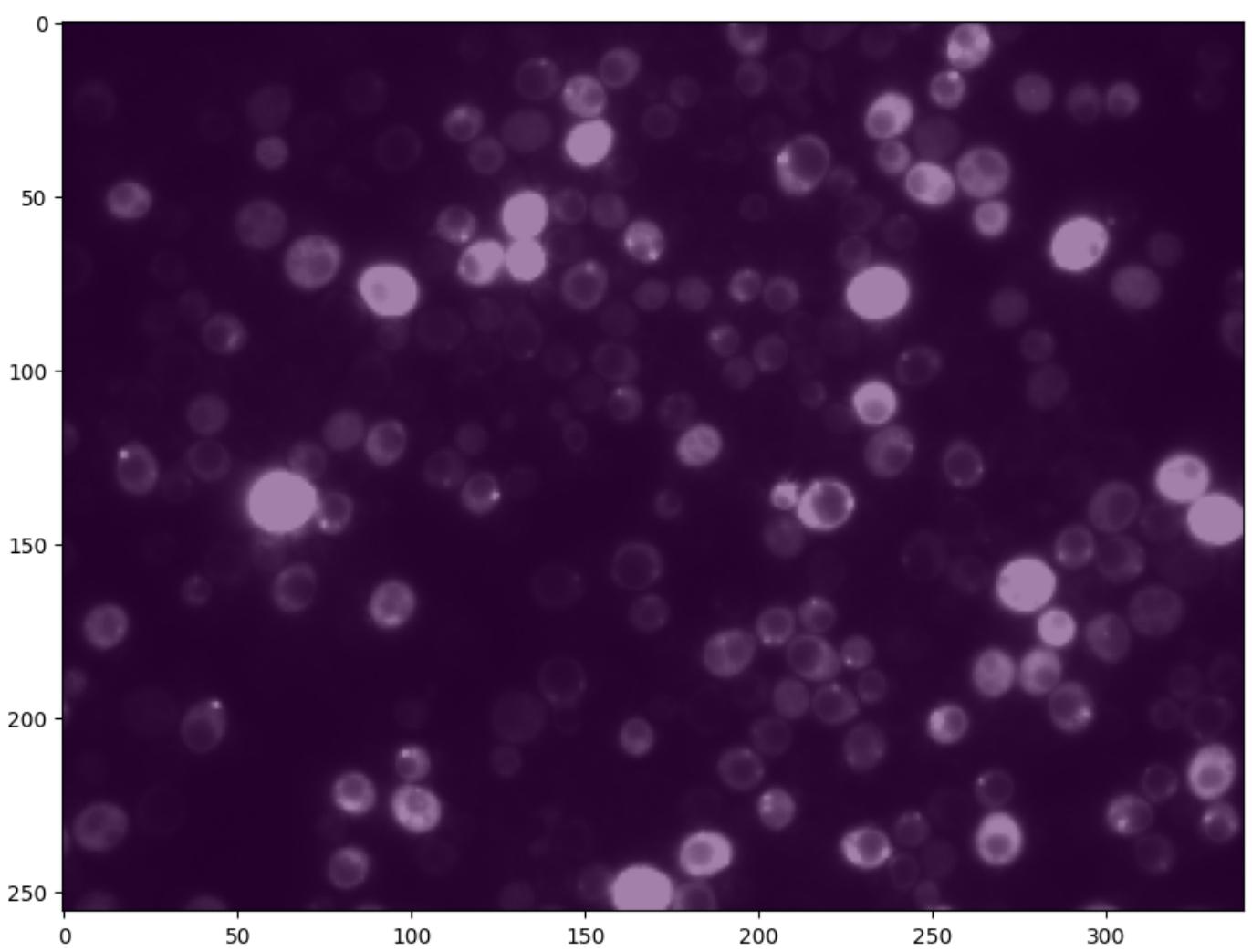
```
In [580...]: channels=[[1,3]]
masks, flows, styles, diams = model.eval(image, diameter=None, channels=channels)
```

```
In [582...]: fig, ax = plt.subplots(figsize=(10,10))
ax.imshow(image[:, :], cmap='gray')
ax.imshow(masks, alpha=0.5);
```



```
In [583]: masks, flows, styles, diams = model.eval(image, diameter=100, channels=channels)
```

```
In [585]: fig, ax = plt.subplots(figsize=(10,10))
ax.imshow(image[:, :], cmap='gray')
ax.imshow(masks, alpha=0.5);
```



```
In [586...]: model = models.Cellpose(model_type='nuclei')

channels = [3,0]
masks, flows, styles, diams = model.eval(image, diameter=100, channels=channels)

100%|██████████| 25.3M/25.3M [00:24<00:00, 1.06MB/s]
100%|██████████| 3.54k/3.54k [00:00<00:00, 1.78MB/s]
```

```
In [587...]: import napari
from napari.utils import nbscreenshot
```

```
In [588...]: viewer = napari.Viewer()
```

```
In [605...]: import requests
import numpy as np
import matplotlib.pyplot as plt
from PIL import Image
from io import BytesIO

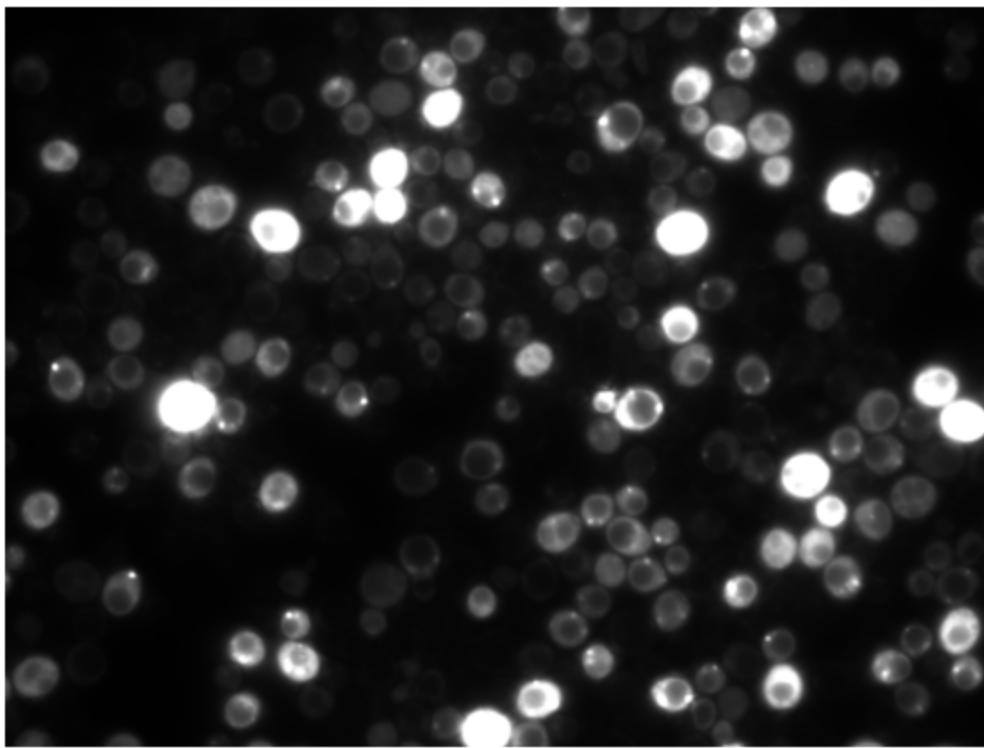
# Fetch the image data from the URL
url = 'https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif'
response = requests.get(url)
if response.status_code == 200:
    # Read the image data using PIL
    image = Image.open(BytesIO(response.content))

    # Convert the image to numpy array
    image_array = np.array(image)
    # print(image_array)
```

```

# Display the image using Matplotlib
plt.imshow(image_array, cmap='gray')
plt.axis('off') # Hide axis
plt.show()
else:
    print("Failed to fetch the image. Status code:", response.status_code)

```



In [608...]

```

import requests
import numpy as np
import matplotlib.pyplot as plt
from PIL import Image
from io import BytesIO

# Fetch the image data from the URL
url = 'https://cildata.crbs.ucsd.edu/media/images/13901/13901.tif'
response = requests.get(url)
if response.status_code == 200:
    # Read the image data using PIL
    image = Image.open(BytesIO(response.content))

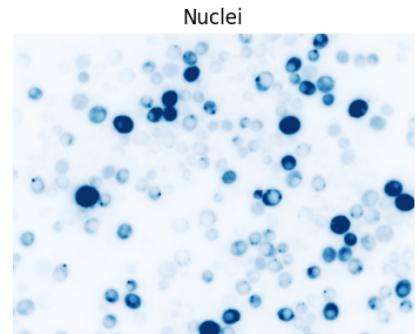
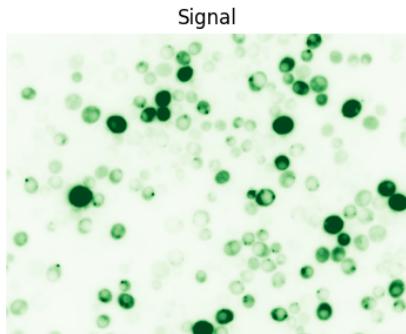
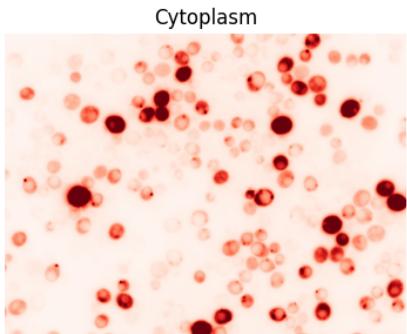
    # Convert the image to numpy array
    image_array = np.array(image)

    # Split the image into channels
    cytoplasm = image_array[:, :]
    signal = image_array[:, :]
    nuclei = image_array[:, :]

    # Display each channel with the desired colormap using Matplotlib
    fig, axes = plt.subplots(1, 3, figsize=(15, 5))
    axes[0].imshow(cytoplasm, cmap='Reds')
    axes[0].set_title('Cytoplasm')
    axes[0].axis('off')
    axes[1].imshow(signal, cmap='Greens')
    axes[1].set_title('Signal')
    axes[1].axis('off')
    axes[2].imshow(nuclei, cmap='Blues')
    axes[2].set_title('Nuclei')
    axes[2].axis('off')
    plt.show()

```

```
    else:  
        print("Failed to fetch the image. Status code:", response.status_code)
```



```
In [610]: viewer.add_labels(masks);
```

```
In [614]:  
import skimage  
from magicgui import magicgui  
from napari.types import ImageData, LabelsData
```

```
In [615]:  
def my_thresholder(image: ImageData, th_level: int=0) -> LabelsData:  
  
    label_image = image > th_level  
    label_image = skimage.morphology.label(label_image)  
  
    return(label_image)  
  
thresholding_widget = magicgui(my_thresholder)
```

```
In [1]:  
import tkinter as tk  
  
class ThresholdingWidget(tk.Toplevel):  
    def __init__(self, parent):  
        super().__init__(parent)  
        self.title('Thresholding Widget')  
        self.geometry('300x200')  
  
        self.label = tk.Label(self, text='Thresholding Parameters')  
        self.label.pack(pady=10)  
  
        self.threshold_button = tk.Button(self, text='Apply Threshold')  
        self.threshold_button.pack(pady=10)  
  
class MyApplication:  
    def __init__(self, root):  
        self.root = root  
        self.root.title('My Application')  
        self.root.geometry('800x600')  
  
        # Create the thresholding widget  
        self.thresholding_widget = ThresholdingWidget(root)  
  
def main():  
    root = tk.Tk()  
    app = MyApplication(root)  
    root.mainloop()  
  
if __name__ == '__main__':  
    main()
```