

ZTF24aahgqwk in NGC 3443

Light Curve Notebook

This notebook begins with the 36 stacked images produced by our [Calibration Notebook](#), and produces a light curve, consisting of 18 Sloan r' and 18 Sloan g' data points.

See [a least squares notebook](#) for background for the method used below.

```
In [1]: import os
import numpy as np
from scipy.optimize import least_squares
from astropy import units as u
from astropy.nddata import CCDData
from astropy.io import fits
from ccdproc import ImageFileCollection
import astroalign as aa
import matplotlib.pyplot as plt
%matplotlib inline
from math import log10, floor, sqrt, log, exp, pi

# THIS COMMENT IS THE LONGEST A LINE CAN BE AND STILL RENDER COMPLETELY WHEN PRINTING IN LANDSCAPE MODE.
# THIS COMMENT IS 72 CHARACTERS WITHOUT COUNTING THE NEWLINE AT THE END.

# This notebook needs to be able to find the stacked images.

home_directory = os.path.expanduser('~')
supernova_project_directory = os.path.join(home_directory, 'Projects', 'supernova-observation')
stacked_directory = os.path.join(supernova_project_directory, 'analyses', 'ZTF24aahgqwk', 'stacked')

# The 36 images are in the stacked directory. There were 18 observation sessions with 2 filters each.

# filters
```

```
filters = ['r', 'g']
filter_full_names = ["Sloan r'", "Sloan g'"]

# observation dates (UTC)

observation_dates = [
    '2024-03-20',
    '2024-03-21',
    '2024-03-23',
    '2024-03-27',
    '2024-04-02',
    '2024-04-03',
    '2024-04-04',
    '2024-04-06',
    '2024-04-10',
    '2024-04-11',
    '2024-04-13',
    '2024-04-17',
    '2024-04-21',
    '2024-04-22',
    '2024-04-23',
    '2024-04-29',
    '2024-04-30',
    '2024-05-02'
]

# We will need to specify rectangles surrounding the target and the reference stars.

# use named tuples to improve readability

from collections import namedtuple

Point = namedtuple('Point', 'x y')
Extent = namedtuple('Extent', 'width height')
Rectangle = namedtuple('Rectangle', 'center extent')

# Various utilities
```

```
def file_for_date_and_filter(date, filter):
    return os.path.join(stacked_directory, date + '-' + filter + '_stacked.fit')

def stacked_image_for_date_and_filter(date, filter):
    file = file_for_date_and_filter(date, filter)
    return CCDDData.read(file, unit=u.adu)

# Log stretch utility

def log_stretch_transform(black_point, saturation_range):

    log_saturation_range = log10(saturation_range)

    def fn(pixel_value):
        pixel_value -= black_point
        if pixel_value <= 1.0:
            return 0
        else:
            log_pixel_value = log10(pixel_value)
            if log_pixel_value >= log_saturation_range:
                return 255;
            else:
                return floor(256 * log_pixel_value / log_saturation_range)

    return fn
```

Specify the Regions of Interest for the Target and Reference Stars

```
In [2]: # Guarantee the extent widths and heights are odd so the loops do not have to handle even and odd cases.
EXTENT_HALF_WIDTH = 10
EXTENT_WIDTH = 2 * EXTENT_HALF_WIDTH + 1
EXTENT_HEIGHT = EXTENT_WIDTH
EXTENT = Extent(EXTENT_WIDTH, EXTENT_HEIGHT)

CENTERS = [
    Point(708, 443), # target
    Point(177, 109), # reference star at far upper left
    Point(112, 368), # reference star at far left
    Point(585, 426), # reference star just left of center
    Point(982, 591), # reference star right of center
    Point(1271, 280), # reference star at far right
]

CENTER_COUNT = len(CENTERS)
```

Display a Representative Image

```
In [3]: first_image = stacked_image_for_date_and_filter('2024-04-03', 'r')

# Log stretch

stretch_function = log_stretch_transform(8, 50)
stretch_transform = np.vectorize(stretch_function)

stretched_image = stretch_transform(first_image.data)

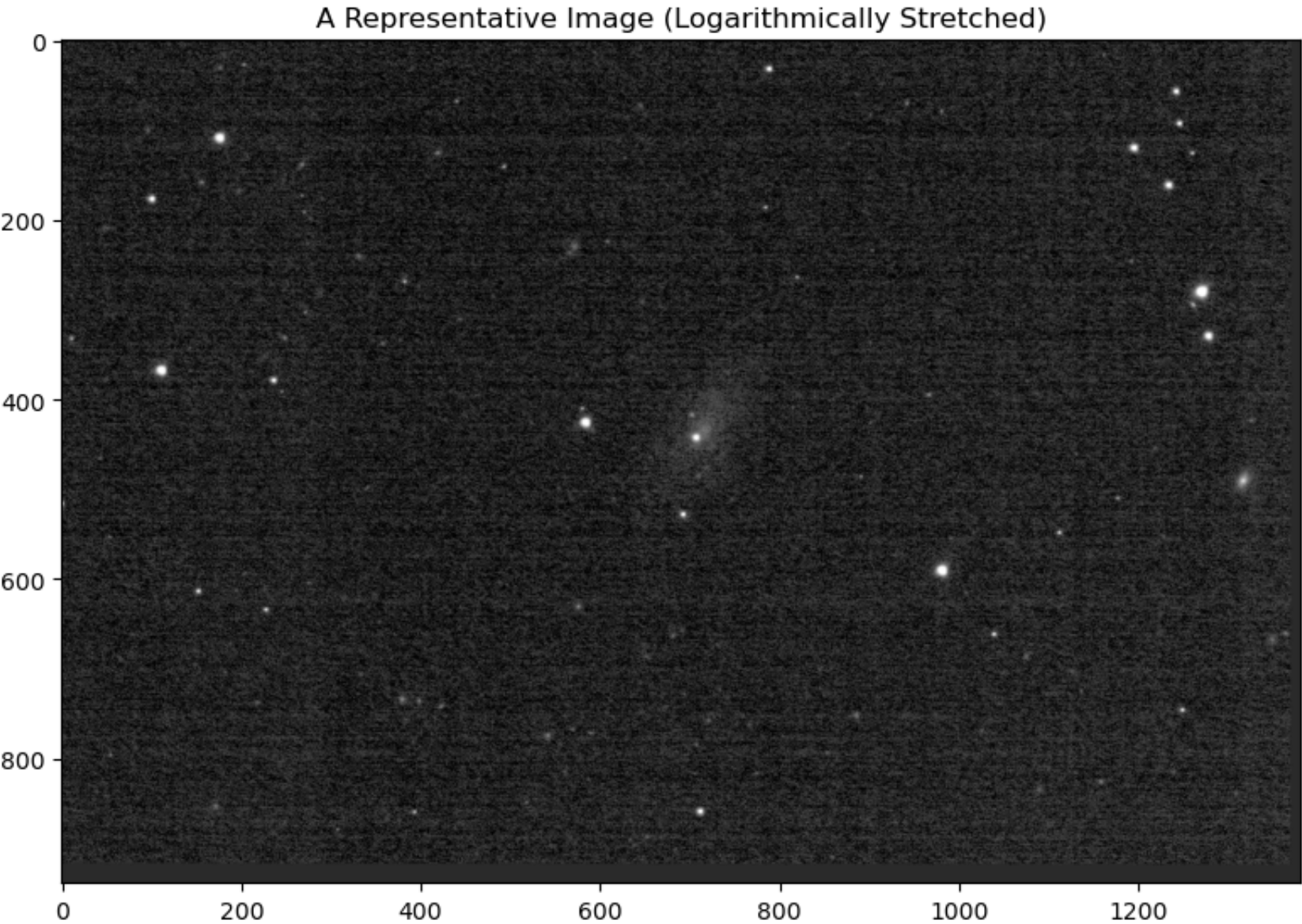
# Display the image

fig, axes = plt.subplots(1, 1, figsize=(8, 8))

axes.imshow(stretched_image, cmap='gray')
axes.set_title("A Representative Image (Logarithmically Stretched)")

plt.tight_layout()
plt.show()
```

```
WARNING: FITSFixedWarning: 'datfix' made the change 'Set MJD-OBS to 60403.212974 from DATE-OBS'. [astropy.wcs.wcs]
WARNING: FITSFixedWarning: 'obsfix' made the change 'Set OBSGEO-X to -2381449.053 from OBSGEO-[LBH].
Set OBSGEO-Y to -4483194.922 from OBSGEO-[LBH].
Set OBSGEO-Z to 3851220.317 from OBSGEO-[LBH]'. [astropy.wcs.wcs]
```



Display a Subframe of the Image

```
In [4]: DISPLAY_WHICH_CENTER = 0  # This determines what the subframe will be centered on

display_extent_half = 300
display_extent_width = 2 * display_extent_half + 1
display_extent_height = display_extent_width
display_extent = Extent(display_extent_width, display_extent_height)

display_center = CENTERS[DISPLAY_WHICH_CENTER]
display_left = display_center.x - display_extent_half
display_right = display_left + display_extent_width
display_top = display_center.y - display_extent_half
display_bottom = display_top + display_extent_height

subframe = stretched_image[display_top:display_bottom, display_left:display_right]

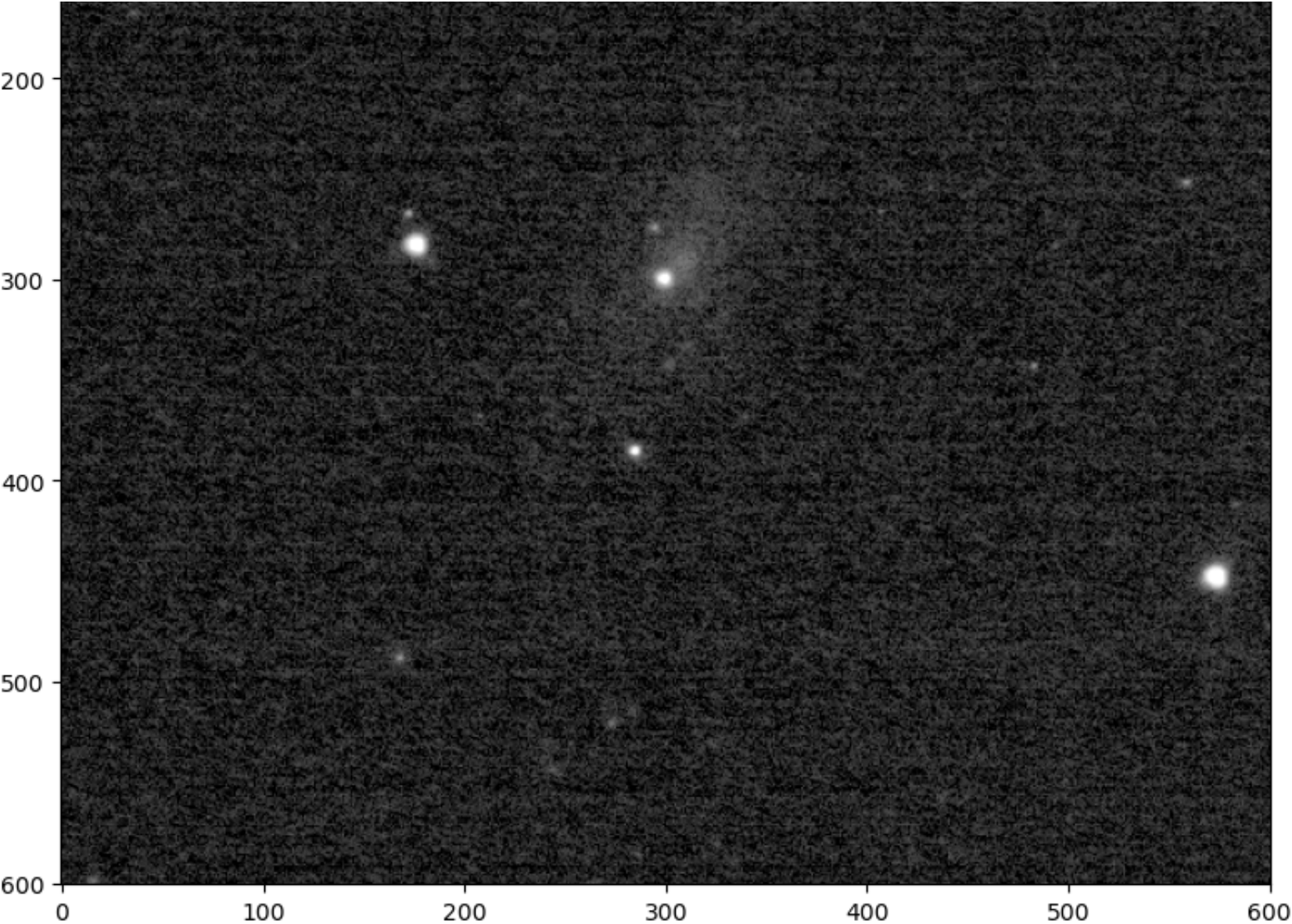
# Display the representative subtracted dark

fig, axes = plt.subplots(1, 1, figsize=(8, 8))

axes.imshow(subframe, cmap='gray')
axes.set_title("Subframe (Logarithmically Stretched)")

plt.tight_layout()
plt.show()
```





Code for Least Squares Fit

```

In [5]: def sigma_squared_for_fwhm(fwhm):
        return fwhm**2 / (8 * log(2))

def make_gaussian_with_flux(fwhm, flux):
    sigma_squared = sigma_squared_for_fwhm(fwhm)
    flux_factor = flux / (2 * pi * sigma_squared)
    def gaussian(x, y):
        return flux_factor * exp(-(x**2 + y**2) / 2 / sigma_squared)
    return gaussian

def model_data_for_parameters(extent, total_background, fwhm, flux, center_x, center_y):
    model_data = np.zeros([extent.height, extent.width]) # height goes before width in the array shape
    model_data.fill(total_background)
    gaussian = make_gaussian_with_flux(fwhm, flux)
    # IS THERE A WAY TO USE NP.VECTORIZE???
    for j in range(extent.height):
        for i in range(extent.width):
            model_data[j, i] += gaussian(
                i - extent.width // 2 - center_x,
                j - extent.height // 2 - center_y
            )
    return model_data

PINDEX_TARGET_BACKGROUND = 0 # NB: THE TARGET BACKGROUND IS IN ADDITION TO THE GENERAL_BACKGROUND
PINDEX_GENERAL_BACKGROUND = 1
PINDEX_FWHM = 2

POFFSETINDEX_FLUX = 0
POFFSETINDEX_CENTER_X = 1 # NB: THIS IS RELATIVE TO THE CENTER OF THE EXTENT
POFFSETINDEX_CENTER_Y = 2 # NB: THIS IS RELATIVE TO THE CENTER OF THE EXTENT

def roi_residuals(image_data, target_index, center, extent, parameter_vector):
    left = center.x - extent.width // 2
    right = left + extent.width
    top = center.y - extent.height // 2
    bottom = top + extent.height
    roi_data = image_data[top:bottom, left:right]
    target_background = parameter_vector[PINDEX_TARGET_BACKGROUND]

```

```

general_background = parameter_vector[PINDEX_GENERAL_BACKGROUND]
total_background = target_background + general_background if target_index==0 else general_background
fwhm = parameter_vector[PINDEX_FWHM]
base_index = 3 + 3 * target_index
flux = parameter_vector[base_index + POFFSETINDEX_FLUX]
center_x = parameter_vector[base_index + POFFSETINDEX_CENTER_X]
center_y = parameter_vector[base_index + POFFSETINDEX_CENTER_Y]
model_data = model_data_for_parameters(extent, total_background, fwhm, flux, center_x, center_y)
return roi_data - model_data

def make_residuals_function(image_data, centers, extent):
    def residuals_function(parameter_vector):
        all_roi_residuals = [
            roi_residuals(image_data, i, center, extent, parameter_vector)
            for i, center in enumerate(centers)
        ]
        return np.concatenate(all_roi_residuals).ravel()

    return residuals_function

```

Testing

We test the least squares fitting code above with generated data.

Generate the Data

```

In [18]: TEST_DATA_WIDTH = 300
TEST_DATA_HEIGHT = 200

TEST_EXTENT_HALF_WIDTH = 10
TEST_EXTENT_WIDTH = 2 * TEST_EXTENT_HALF_WIDTH + 1
TEST_EXTENT_HEIGHT = TEST_EXTENT_WIDTH
TEST_EXTENT = Extent(TEST_EXTENT_WIDTH, TEST_EXTENT_HEIGHT)

TEST_CENTERS = [
    Point(20, 40), # test target

```

```

    Point(50, 150), # test reference star
]

TEST_CENTER_OFFSETS = [
    Point(2, 6), # test target
    Point(-2, -5), # test reference star
]

TEST_CENTERS_WITH_OFFSETS = [
    Point(TEST_CENTERS[i].x + TEST_CENTER_OFFSETS[i].x, TEST_CENTERS[i].y + TEST_CENTER_OFFSETS[i].y)
    for i in range(len(TEST_CENTERS))
]

TEST_CENTERS_COUNT = 2

TEST_TARGET_BACKGROUND = 5.0
TEST_REFERENCE_BACKGROUND = 2.0

TEST_FWHM = 7.0

TEST_FLUXES = [
    250.0,
    1000.0
]

TEST_TARGET_GAUSSIAN = make_gaussian_with_flux(TEST_FWHM, TEST_FLUXES[0])
TEST_REFERENCE_GAUSSIAN = make_gaussian_with_flux(TEST_FWHM, TEST_FLUXES[1])

TEST_IMAGE_DATA = np.zeros([TEST_DATA_HEIGHT, TEST_DATA_WIDTH]) # height goes before width in the array

for j in range(TEST_DATA_HEIGHT):
    for i in range(TEST_DATA_WIDTH):
        # which are we closer to?
        distance_to_target_squared = (i - TEST_CENTERS[0].x)**2 + (j - TEST_CENTERS[0].y)**2
        distance_to_reference_squared = (i - TEST_CENTERS[1].x)**2 + (j - TEST_CENTERS[1].y)**2
        closer_to_target = distance_to_target_squared <= distance_to_reference_squared
        total_background = TEST_TARGET_BACKGROUND + TEST_REFERENCE_BACKGROUND \
            if closer_to_target \
            else TEST_REFERENCE_BACKGROUND

```

```
TEST_IMAGE_DATA[j, i] += \
    total_background + \
    TEST_TARGET_GAUSSIAN(i - TEST_CENTERS_WITH_OFFSETS[0].x,
                        j - TEST_CENTERS_WITH_OFFSETS[0].y) + \
    TEST_REFERENCE_GAUSSIAN(i - TEST_CENTERS_WITH_OFFSETS[1].x,
                          j - TEST_CENTERS_WITH_OFFSETS[1].y)
```

Display the Test Image

Near, but not exactly at (20, 40), we have a target with flux 250.0. Around it the total background is 5.0 + 2.0.

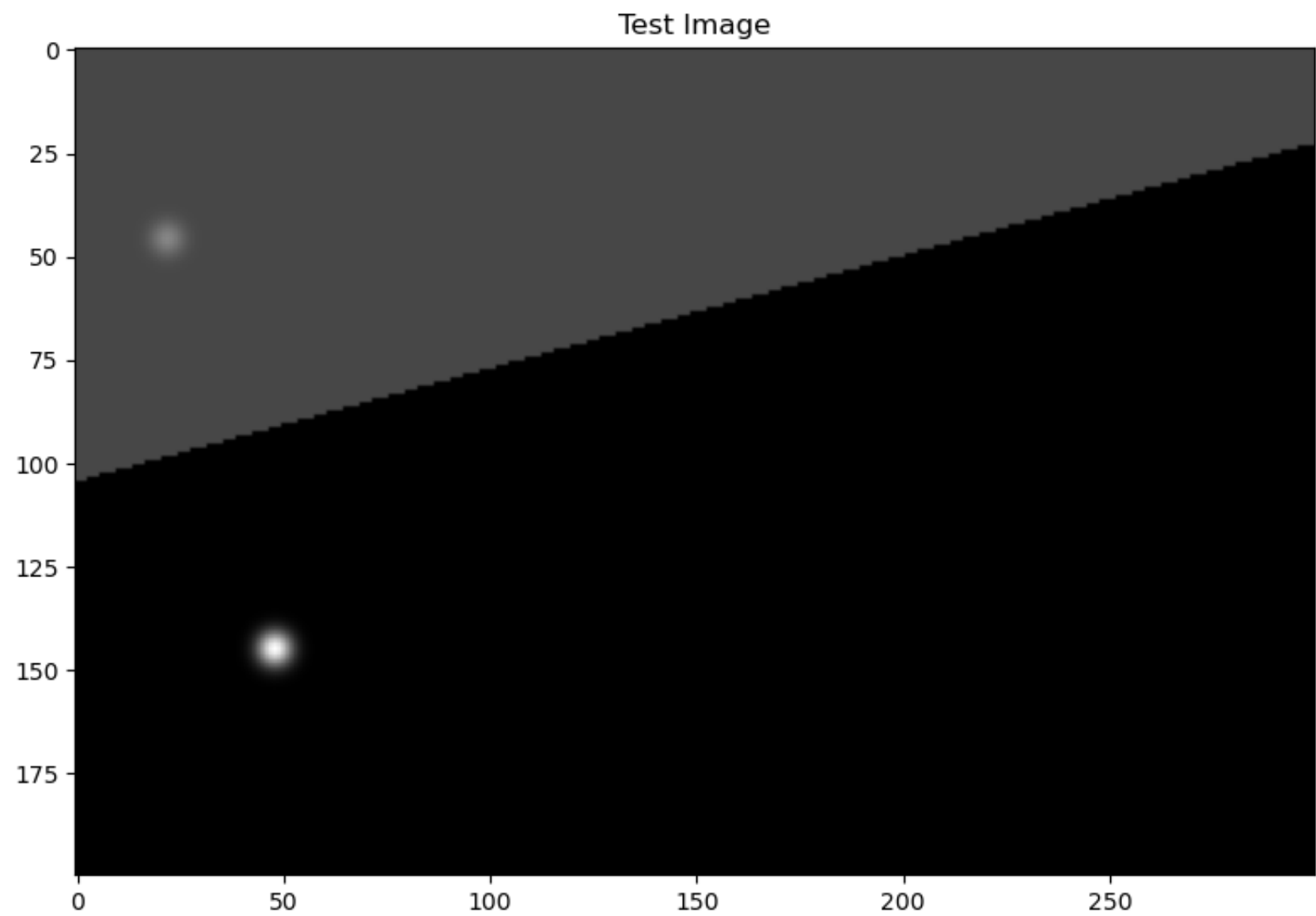
Near, but not exactly at (50, 150), we have a reference star with flux 1000.0. Around it the background is 2.0.

```
In [20]: # Display the representative subtracted dark

fig, axes = plt.subplots(1, 1, figsize=(8, 8))

axes.imshow(TEST_IMAGE_DATA, cmap='gray')
axes.set_title("Test Image")

plt.tight_layout()
plt.show()
```



Fit the Test Image

```
In [21]: TEST_INITIAL_GUESS_FOR_TARGET_BACKGROUND = 0.0
TEST_INITIAL_GUESS_FOR_GENERAL_BACKGROUND = 0.0
TEST_INITIAL_GUESS_FOR_FWHM = 5.0

TEST_INITIAL_PARAMETER_VECTOR = [
    TEST_INITIAL_GUESS_FOR_GENERAL_BACKGROUND,
    TEST_INITIAL_GUESS_FOR_GENERAL_BACKGROUND,
    TEST_INITIAL_GUESS_FOR_FWHM
]

for index in range(TEST_CENTERS_COUNT):
    TEST_INITIAL_PARAMETER_VECTOR.append(10.0) # Initial guess for flux
    TEST_INITIAL_PARAMETER_VECTOR.append(0.0)  # Initial guess for center_x
    TEST_INITIAL_PARAMETER_VECTOR.append(0.0)  # Initial guess for center_y

TEST_RESIDUALS_FUNCTION = make_residuals_function(TEST_IMAGE_DATA, TEST_CENTERS, TEST_EXTENT)

TEST_result = least_squares(TEST_RESIDUALS_FUNCTION, np.array(TEST_INITIAL_PARAMETER_VECTOR))
```

```
-----
NameError                                Traceback (most recent call last)
Cell In[21], line 19
     14     TEST_INITIAL_PARAMETER_VECTOR.append(0.0) # Initial guess for center_y
     17     TEST_RESIDUALS_FUNCTION = make_residuals_function(TEST_IMAGE_DATA, TEST_CENTERS, TEST_EXTENT)
--> 19     TEST_result = least_squares(TEST_RESIDUALS_FUNCTION, np.array(TEST_INITIAL_PARAMETER_VECTOR))

File /Applications/Anaconda/anaconda3/envs/supernova/lib/python3.10/site-packages/scipy/optimize/_lsq/least_squares.py:830, in least_squares(fun, x0, jac, bounds, method, ftol, xtol, gtol, x_scale, loss, f_scale, diff_step, tr_solver, tr_options, jac_sparsity, max_nfev, verbose, args, kwargs)
     827 if method == 'trf':
     828     x0 = make_strictly_feasible(x0, lb, ub)
--> 830 f0 = fun_wrapped(x0)
     832 if f0.ndim != 1:
     833     raise ValueError("`fun` must return at most 1-d array_like. "
     834                      "f0.shape: {}".format(f0.shape))

File /Applications/Anaconda/anaconda3/envs/supernova/lib/python3.10/site-packages/scipy/optimize/_lsq/least_squares.py:830, in least_squares(fun, x0, jac, bounds, method, ftol, xtol, gtol, x_scale, loss, f_scale, diff_step, tr_solver, tr_options, jac_sparsity, max_nfev, verbose, args, kwargs)
     827 if method == 'trf':
     828     x0 = make_strictly_feasible(x0, lb, ub)
--> 830 f0 = fun_wrapped(x0)
     832 if f0.ndim != 1:
     833     raise ValueError("`fun` must return at most 1-d array_like. "
     834                      "f0.shape: {}".format(f0.shape))
```

```

ast_squares.py:825, in least_squares.<locals>.fun_wrapped(x)
    824 def fun_wrapped(x):
--> 825     return np.atleast_1d(fun(x, *args, **kwargs))

Cell In[5], line 51, in make_residuals_function.<locals>.residuals_function(parameter_vector)
    50 def residuals_function(parameter_vector):
----> 51     all_roi_residuals = [
    52         roi_residuals(image_data, i, center, extent, parameter_vector)
    53         for i, center in enumerate(centers)
    54     ]
    55     return np.concatenate(all_roi_residuals).ravel()

Cell In[5], line 52, in <listcomp>(.0)
    50 def residuals_function(parameter_vector):
    51     all_roi_residuals = [
----> 52         roi_residuals(image_data, i, center, extent, parameter_vector)
    53         for i, center in enumerate(centers)
    54     ]
    55     return np.concatenate(all_roi_residuals).ravel()

Cell In[5], line 46, in roi_residuals(image_data, target_index, center, extent, parameter_vector)
    44 center_x = parameter_vector[base_index + POFFSETINDEX_CENTER_X]
    45 center_y = parameter_vector[base_index + POFFSETINDEX_CENTER_Y]
----> 46 model_data = model_data_for_parameters(extent, total_background, fwhm, flux, center_x, center_y)
    47 return roi_data - model_data

Cell In[5], line 16, in model_data_for_parameters(extent, total_background, fwhm, flux, center_x, center_y)
    14 gaussian = make_gaussian_with_flux(fwhm, flux)
    15 # IS THERE A WAY TO USE NP.VECTORIZE??
----> 16 for j in range(extent_height):
    17     for i in range(extent_width):
    18         model_data[j, i] += gaussian(
    19             i - extent.width // 2 - center_x,
    20             j - extent.height // 2 - center_y
    21         )

NameError: name 'extent_height' is not defined

```