

# Assignment\_3\_answers

November 16, 2024

## Assignment 3

Due EOD Tuesday Oct 1st

### #Question 1

A nuclear fuel pellet is a cylinder, 1.5 cm in length and 1 cm in diameter. Assume the surface temperature is 300 C everywhere. Given temperature probe data below, determine the radial temperature profile in the middle of a nuclear fuel pellet (i.e.:  $T(r, z = 0.75)$ ) using radial basis functions.

```
[1]: import numpy as np

# 20 data points presented in columns: | x | y | z | T |

data = np.array([
    [5.1690e-02, 2.3766e-01, 6.7059e-01, 5.2645e+02],
    [1.1353e-01, 9.4708e-02, 5.3856e-01, 5.5201e+02],
    [1.6676e-01, 1.4358e-01, 4.6936e-01, 5.0802e+02],
    [1.3610e-01, 3.7207e-02, 2.1694e-01, 4.3663e+02],
    [8.9225e-02, 3.7293e-01, 1.1270e+00, 3.9234e+02],
    [1.9001e-01, 3.7240e-01, 8.4774e-01, 3.8872e+02],
    [5.4849e-02, 3.5425e-01, 5.7478e-01, 4.3784e+02],
    [1.7001e-01, 2.0241e-01, 1.2960e+00, 4.0159e+02],
    [2.0606e-01, 3.1594e-01, 6.4077e-01, 4.2652e+02],
    [2.5382e-01, 2.5859e-01, 4.8610e-01, 4.2481e+02],
    [5.6038e-02, 8.2231e-02, 4.2029e-01, 5.3244e+02],
    [3.1242e-01, 8.0489e-02, 1.1530e+00, 4.2453e+02],
    [6.0186e-02, 4.4891e-01, 3.9941e-01, 3.4207e+02],
    [1.5070e-01, 3.4794e-01, 1.5595e-01, 3.4750e+02],
    [1.8215e-01, 3.4388e-01, 1.0478e+00, 3.9963e+02],
    [1.1633e-01, 4.1011e-01, 5.5001e-01, 3.7611e+02],
    [1.2377e-01, 3.3703e-01, 3.7672e-02, 3.1423e+02],
    [4.6378e-02, 3.3653e-01, 1.4434e+00, 3.2345e+02],
    [2.9063e-02, 3.2584e-02, 2.3977e-01, 4.5993e+02],
    [2.1162e-02, 3.8590e-01, 2.5905e-01, 3.6901e+02]
])
```

Consider what you know about this system. What extra information do you have in terms of

### 0.0.1 a) type(s) of symmetry?

{answer}

Answer: 2 - azimuthal symmetry and mirror symmetry about the midplane

### 0.0.2 b) Boundary conditions?

{answer}

Answer: We know the boundary conditions are 300 C around the periphery. This data is not in the data points above and needs to be added in manually.

### 0.1 c) Plot the best guess of the radial temperature gradient

WARNING: RBFs will fail with a linear solver error if two data points exactly overlap.

{Method, implementation, answer (2 points)}

## Answer

```
[2]: import numpy as np
import matplotlib.pyplot as plt
from mpl_toolkits.mplot3d import Axes3D

def T_true(r, z):
    return 300 + 300*(1- (r / 0.5) ** 2) * (1 - ((z - 0.75) / 0.75) ** 2)

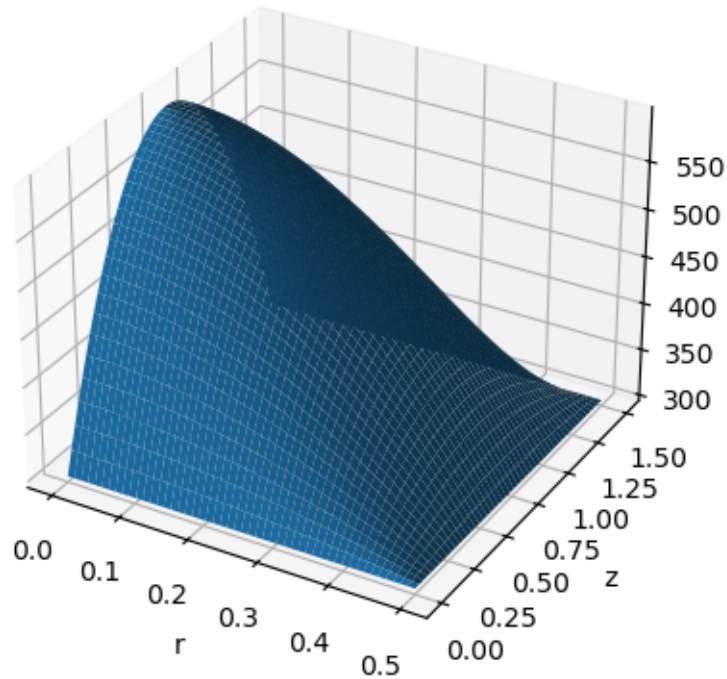
# Create a grid of r and z values
r = np.linspace(0, 0.5, 50)
z = np.linspace(0, 1.5, 50)
R, Z = np.meshgrid(r, z)

# Calculate the temperature at each point in the grid
T = T_true(R, Z)

# Create a 3D plot of the temperature profile
fig = plt.figure()
ax = fig.add_subplot(111, projection='3d')
ax.plot_surface(R, Z, T)
ax.set_xlabel('r')
ax.set_ylabel('z')
ax.set_zlabel('T')
ax.set_title('True Temperature Profile')

plt.show()
```

### True Temperature Profile



```
[3]: # make radial symmetry
dataR = np.sqrt(data[:,0]**2 + data[:,1]**2)
# make z symmetric about midplane
dataZ = abs(data[:,2] - 0.75)

# Data in R Z T columns
dataRZ = np.column_stack((dataR, dataZ, data[:,3]))

n = 10
data_BC_top = np.column_stack([np.linspace(0, 0.49, n), np.ones(n)*.75, np.
    ↳ ones(n)*300])
data_BC_side = np.column_stack([np.ones(n)*.5, np.linspace(0, 0.75, n), np.
    ↳ ones(n)*300])

dataRZ2 = np.vstack([dataRZ, data_BC_top, data_BC_side])

print(dataRZ2)

from scipy.interpolate import RBFInterpolator
```

```
rbf = RBFInterpolator(dataRZ2[:, :2], dataRZ2[:, 2])
```

```
[ [2.43216224e-01 7.94100000e-02 5.26450000e+02]
  [1.47846766e-01 2.11440000e-01 5.52010000e+02]
  [2.20054798e-01 2.80640000e-01 5.08020000e+02]
  [1.41094191e-01 5.33060000e-01 4.36630000e+02]
  [3.83455194e-01 3.77000000e-01 3.92340000e+02]
  [4.18073630e-01 9.77400000e-02 3.88720000e+02]
  [3.58471024e-01 1.75220000e-01 4.37840000e+02]
  [2.64335409e-01 5.46000000e-01 4.01590000e+02]
  [3.77198631e-01 1.09230000e-01 4.26520000e+02]
  [3.62344284e-01 2.63900000e-01 4.24810000e+02]
  [9.95097724e-02 3.29710000e-01 5.32440000e+02]
  [3.22621660e-01 4.03000000e-01 4.24530000e+02]
  [4.52926642e-01 3.50590000e-01 3.42070000e+02]
  [3.79173751e-01 5.94050000e-01 3.47500000e+02]
  [3.89142746e-01 2.97800000e-01 3.99630000e+02]
  [4.26289668e-01 1.99990000e-01 3.76110000e+02]
  [3.59037928e-01 7.12328000e-01 3.14230000e+02]
  [3.39710700e-01 6.93400000e-01 3.23450000e+02]
  [4.36620548e-02 5.10230000e-01 4.59930000e+02]
  [3.86479806e-01 4.90950000e-01 3.69010000e+02]
  [0.00000000e+00 7.50000000e-01 3.00000000e+02]
  [5.44444444e-02 7.50000000e-01 3.00000000e+02]
  [1.08888889e-01 7.50000000e-01 3.00000000e+02]
  [1.63333333e-01 7.50000000e-01 3.00000000e+02]
  [2.17777778e-01 7.50000000e-01 3.00000000e+02]
  [2.72222222e-01 7.50000000e-01 3.00000000e+02]
  [3.26666667e-01 7.50000000e-01 3.00000000e+02]
  [3.81111111e-01 7.50000000e-01 3.00000000e+02]
  [4.35555556e-01 7.50000000e-01 3.00000000e+02]
  [4.90000000e-01 7.50000000e-01 3.00000000e+02]
  [5.00000000e-01 0.00000000e+00 3.00000000e+02]
  [5.00000000e-01 8.33333333e-02 3.00000000e+02]
  [5.00000000e-01 1.66666667e-01 3.00000000e+02]
  [5.00000000e-01 2.50000000e-01 3.00000000e+02]
  [5.00000000e-01 3.33333333e-01 3.00000000e+02]
  [5.00000000e-01 4.16666667e-01 3.00000000e+02]
  [5.00000000e-01 5.00000000e-01 3.00000000e+02]
  [5.00000000e-01 5.83333333e-01 3.00000000e+02]
  [5.00000000e-01 6.66666667e-01 3.00000000e+02]
  [5.00000000e-01 7.50000000e-01 3.00000000e+02] ]
```

```
[9]: # prompt: plot rbf over dataR from 0 to .5, and dataZ from 0 to .75
```

```
import numpy as np
import matplotlib.pyplot as plt
```

```

from mpl_toolkits.mplot3d import Axes3D
from scipy.interpolate import RBFInterpolator

# Assuming dataR and dataZ are defined as in the previous code

r_interp = np.linspace(0, 0.5, 50)
z_interp = np.linspace(0, 0.75, 50)
R_interp, Z_interp = np.meshgrid(r_interp, z_interp)

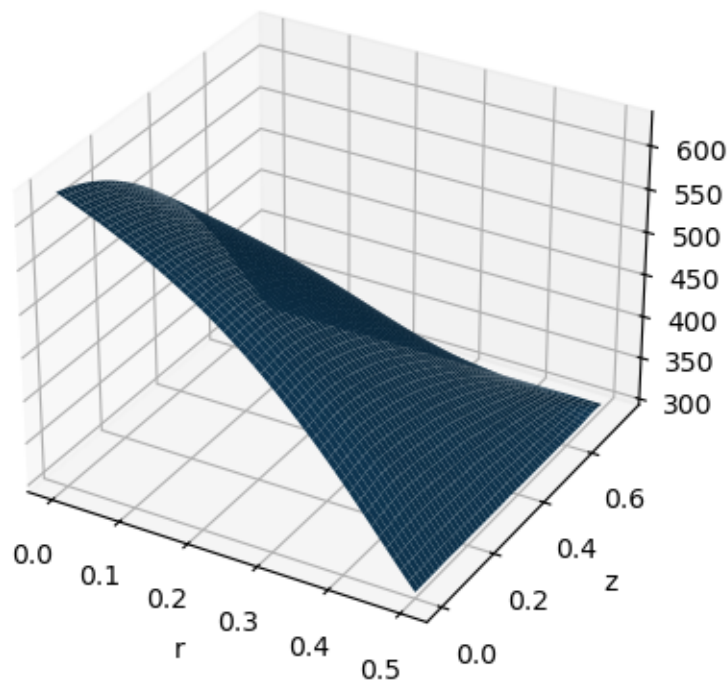
T_interp = rbf(np.column_stack((R_interp.flatten(), Z_interp.flatten()))).
    ↪ reshape(R_interp.shape)

# Create a 3D plot of the interpolated temperature profile
fig = plt.figure()
ax = fig.add_subplot(111, projection='3d')
ax.plot_surface(R_interp, Z_interp, T_interp)
ax.set_xlabel('r')
ax.set_ylabel('z')
ax.set_zlabel('T')
ax.set_title('Interpolated Temperature Profile')

plt.show()

```

Interpolated Temperature Profile



```
[10]: # prompt: Plot the temperature profile over R from 0 to .5 at z=0

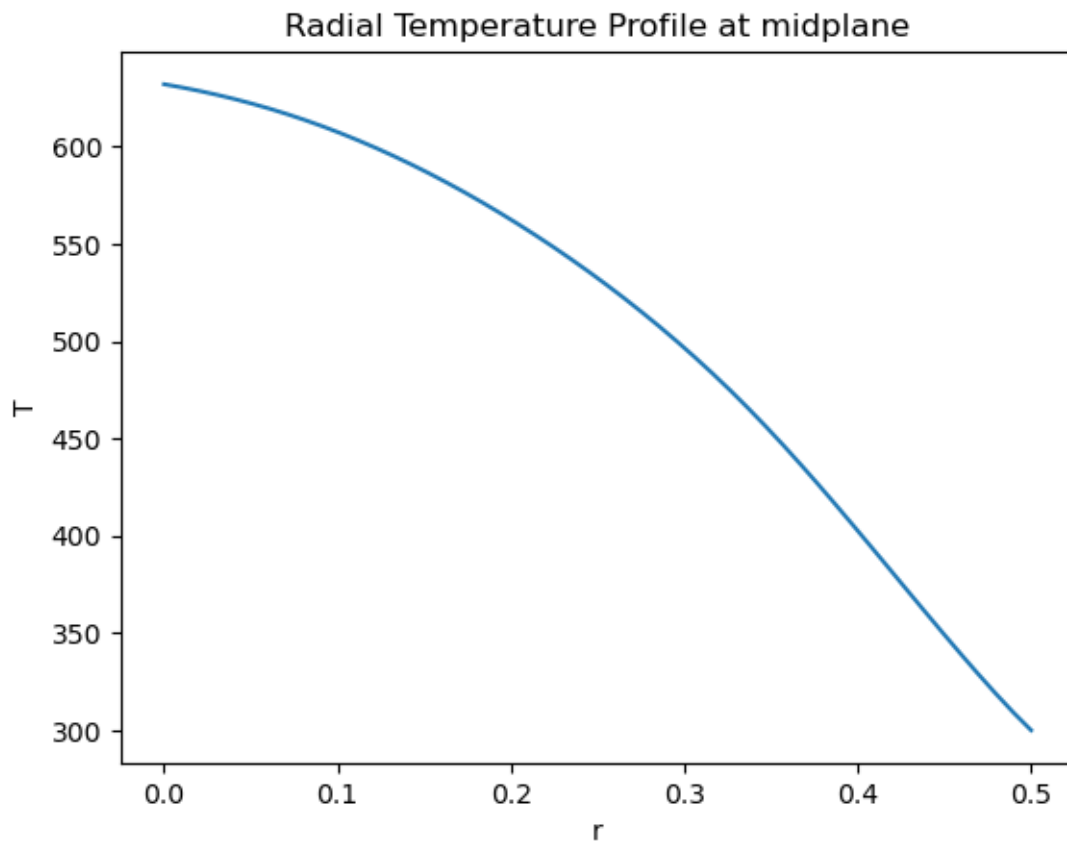
import numpy as np
import matplotlib.pyplot as plt

# Assuming r_interp, z_interp, and T_interp are defined as in the previous code

# Find the index of z=0 in z_interp
z_0_index = np.argmin(np.abs(z_interp - 0))

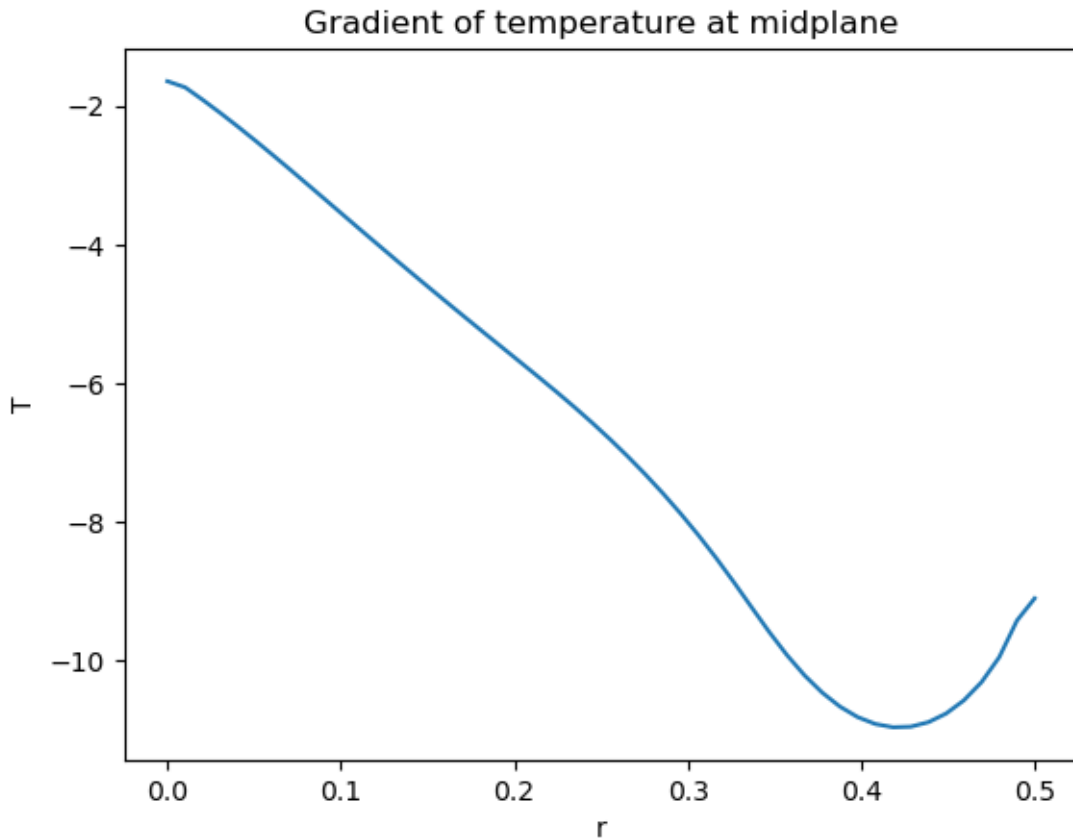
# Extract the temperature profile at z=0
T_interp_z0 = T_interp[:, z_0_index]

# Plot the temperature profile
plt.plot(r_interp, T_interp_z0)
plt.xlabel('r')
plt.ylabel('T')
plt.title('Radial Temperature Profile at midplane')
plt.show()
```



The gradient is:

```
[12]: plt.plot(r_interp, np.gradient(T_interp_z0))  
plt.xlabel('r')  
plt.ylabel('T')  
plt.title('Gradient of temperature at midplane')  
plt.show()
```



## 1 Question 2

You run an experiment and obtain the following data:

x	y1	y2	y3	y4	y5
0.00	-29.49	-2.14	15.88	22.69	28.53
1.11	2.83	18.02	-25.45	-32.45	7.50
2.22	1.97	-10.49	-0.18	-32.10	-40.31
3.33	-38.09	-46.16	-7.87	-33.97	-38.39
4.44	-3.97	-32.22	-33.95	-11.07	-32.47

x	y1	y2	y3	y4	y5
5.56	4.45	-10.88	20.43	6.57	-8.49
6.67	50.22	51.29	80.02	66.15	84.90
7.78	164.11	190.26	160.94	182.35	163.18
8.89	331.75	306.51	278.40	302.13	335.44
10.00	517.06	483.20	476.73	512.16	500.64

```
[6]: import numpy as np

# Define the table as a list of lists
d = np.array([
    [0.00, -29.49, -2.14, 15.88, 22.69, 28.53],
    [1.11, 2.83, 18.02, -25.45, -32.45, 7.50],
    [2.22, 1.97, -10.49, -0.18, -32.10, -40.31],
    [3.33, -38.09, -46.16, -7.87, -33.97, -38.39],
    [4.44, -3.97, -32.22, -33.95, -11.07, -32.47],
    [5.56, 4.45, -10.88, 20.43, 6.57, -8.49],
    [6.67, 50.22, 51.29, 80.02, 66.15, 84.90],
    [7.78, 164.11, 190.26, 160.94, 182.35, 163.18],
    [8.89, 331.75, 306.51, 278.40, 302.13, 335.44],
    [10.00, 517.06, 483.20, 476.73, 512.16, 500.64]
])
```

1.1 a) Determine the best cubic polynomial fit to this data with the uncertainty  
{method, implementation, answer}

```
[7]: # prompt: plot the curve  $x^3-5x^2$  from 0 to 10. For every step, sample it 5
      ↪ times with uniform error. Plot the true and noisy signal. Assemble the x,
      ↪ and 5 noisy signals together

import numpy as np
import matplotlib.pyplot as plt

# Define the true function
def true_function(x):
    return x**3 - 5*x**2

# Generate x values
x = np.linspace(0, 10, 10)

# Calculate the true y values
y_true = true_function(x)

# # Create noisy signals
# noisy_signals = []
```



```

# for i in range(5):
#     noise = np.random.uniform(-30, 30, size=len(x))
#     y_noisy = y_true + noise
#     noisy_signals.append(y_noisy)

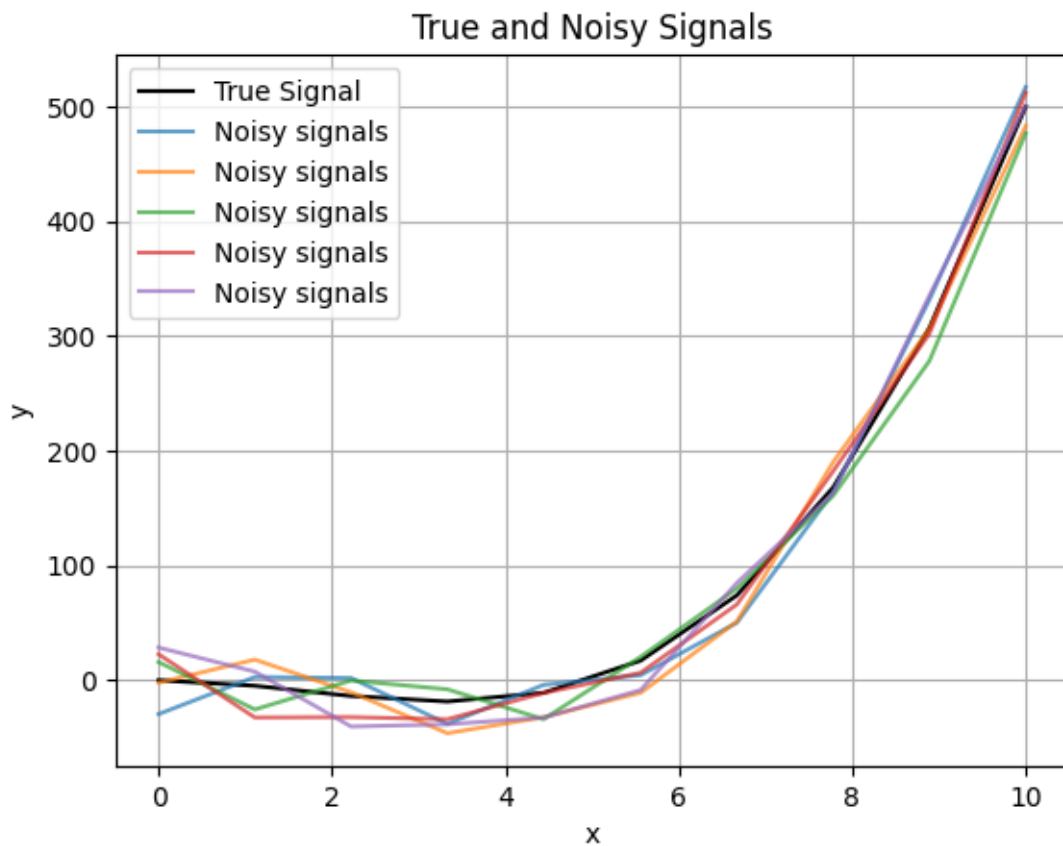
x, noisy_signals = d[:,0], d[:,1:]

# Plot the true signal
plt.plot(x, y_true, label='True Signal', color='black')

plt.plot(x, noisy_signals, label=f'Noisy signals', alpha = 0.7)

plt.xlabel('x')
plt.ylabel('y')
plt.title('True and Noisy Signals')
plt.legend()
plt.grid(True)
plt.show()

```



```
[8]: import numpy as np

# Assuming 'data' is defined as in the preceding code

# Calculate the mean of the last 5 columns
mean_last_5 = np.mean(d[:, -5:], axis=1)

# Calculate the variance of the last 5 columns
variance_last_5 = np.var(d[:, -5:], axis=1)
print(d[:,0])
print(mean_last_5)
print(variance_last_5)

# Create a table using the first column, mean, and variance
table_data = np.column_stack([d[:,0], mean_last_5, variance_last_5])

[ 0.    1.11  2.22  3.33  4.44  5.56  6.67  7.78  8.89 10. ]
[ 7.094 -5.91 -16.222 -32.896 -22.736  2.416  66.516 172.168 310.846
 497.958]
[440.717384 383.00876 290.698616 172.109904 159.741824 128.324304
 203.570824 140.555416 437.870904 248.440576]
```

```
[9]: import numpy as np
import matplotlib.pyplot as plt

x = table_data[:, 0]
y_mean = table_data[:, 1]
y_std = table_data[:, 2]

# Cubic polynomial fit without weights
coeffs_no_weights = np.polyfit(x, y_mean, 3)
polynomial_no_weights = np.poly1d(coeffs_no_weights)

# Cubic polynomial fit with weights (using 1/std_dev as weight)
weights = 1 / y_std
coeffs_with_weights = np.polyfit(x, y_mean, 3, w=weights)
polynomial_with_weights = np.poly1d(coeffs_with_weights)

# Define the true function
def true_function(x):
    return x**3 - 5*x**2

# Generate x values for plotting
x_plot = np.linspace(0, 10, 100)

# Calculate the true function values
y_true = true_function(x_plot)
```

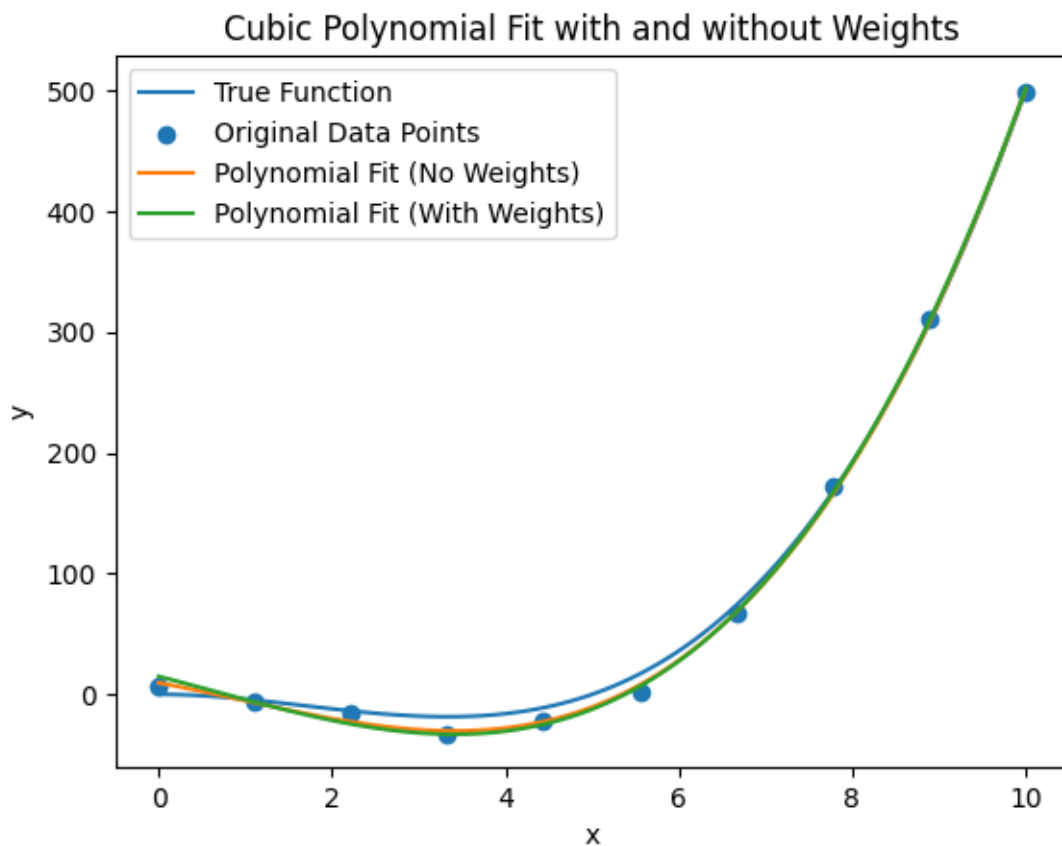
```

# Calculate the polynomial values for plotting
y_no_weights = polynomial_no_weights(x_plot)
y_with_weights = polynomial_with_weights(x_plot)

# Plot the true function, original points, and both polynomials
plt.plot(x_plot, y_true, label='True Function')
plt.scatter(x, y_mean, label='Original Data Points')
plt.plot(x_plot, y_no_weights, label='Polynomial Fit (No Weights)')
plt.plot(x_plot, y_with_weights, label='Polynomial Fit (With Weights)')

plt.xlabel('x')
plt.ylabel('y')
plt.title('Cubic Polynomial Fit with and without Weights')
plt.legend()
plt.show()

```



1.2 b) Your manager thinks this should be a quadratic. Which do you think it should be and why?

{Answer}

```
[10]: # prompt: repeat the polyfit with a quadratic using the weights

import matplotlib.pyplot as plt
import numpy as np
# Assuming 'data' and 'table_data' are defined as in the preceding code

x = table_data[:, 0]
y_mean = table_data[:, 1]
y_std = table_data[:, 2]

# Quadratic polynomial fit with weights (using 1/std_dev as weight)
weights = 1 / y_std
coeffs_with_weights = np.polyfit(x, y_mean, 2, w=weights)
polynomial_with_weights = np.poly1d(coeffs_with_weights)

# Define the true function
def true_function(x):
    return x**3 - 5*x**2

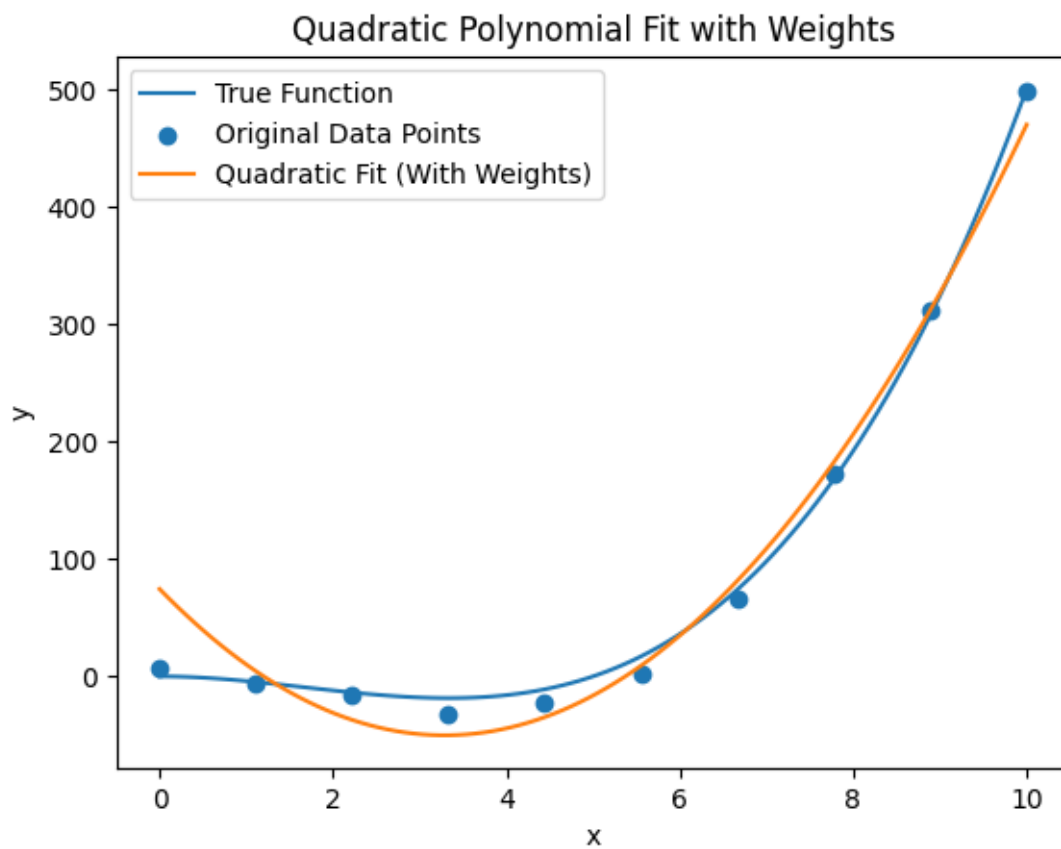
# Generate x values for plotting
x_plot = np.linspace(0, 10, 100)

# Calculate the true function values
y_true = true_function(x_plot)

# Calculate the polynomial values for plotting
y_with_weights = polynomial_with_weights(x_plot)

# Plot the true function, original points, and both polynomials
plt.plot(x_plot, y_true, label='True Function')
plt.scatter(x, y_mean, label='Original Data Points')
plt.plot(x_plot, y_with_weights, label='Quadratic Fit (With Weights)')

plt.xlabel('x')
plt.ylabel('y')
plt.title('Quadratic Polynomial Fit with Weights')
plt.legend()
plt.show()
```



[10]: