

MA332 Homework 4

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```
In [1]: import numpy as np
import matplotlib.pyplot as plt
```

Divided differences and nested polynomial functions from class:

```
In [2]: def newtons_divided_diff(x, y):

    n = len(x)

    div_diff = np.zeros((n, n))
    div_diff[:,0] = np.transpose(y)

    for col in range(1, n):
        for row in range(0, n-col):
            div_diff[row, col] = (
                (div_diff[row+1, col-1] - div_diff[row, col-1])
                / (x[row+col] - x[row]))

    return div_diff[0,:]
```

```
In [3]: def nested_poly(deg, div_diff_coeff, x_samples, interp_pts):

    y = div_diff_coeff[deg]

    for k in range(deg, 0, -1):
        y = y*(x_samples - interp_pts[k-1]) + div_diff_coeff[k-1]

    return y
```

1.

$$f(x) = \frac{1}{x^2 + 5} \quad -10 \leq x \leq 10$$

Define $f(x)$

```
In [21]: def f(x): return 1/(x**2 + 5)
```

(a)

```

In [22]: even_inter_pts = np.linspace(-10, 10, 9)

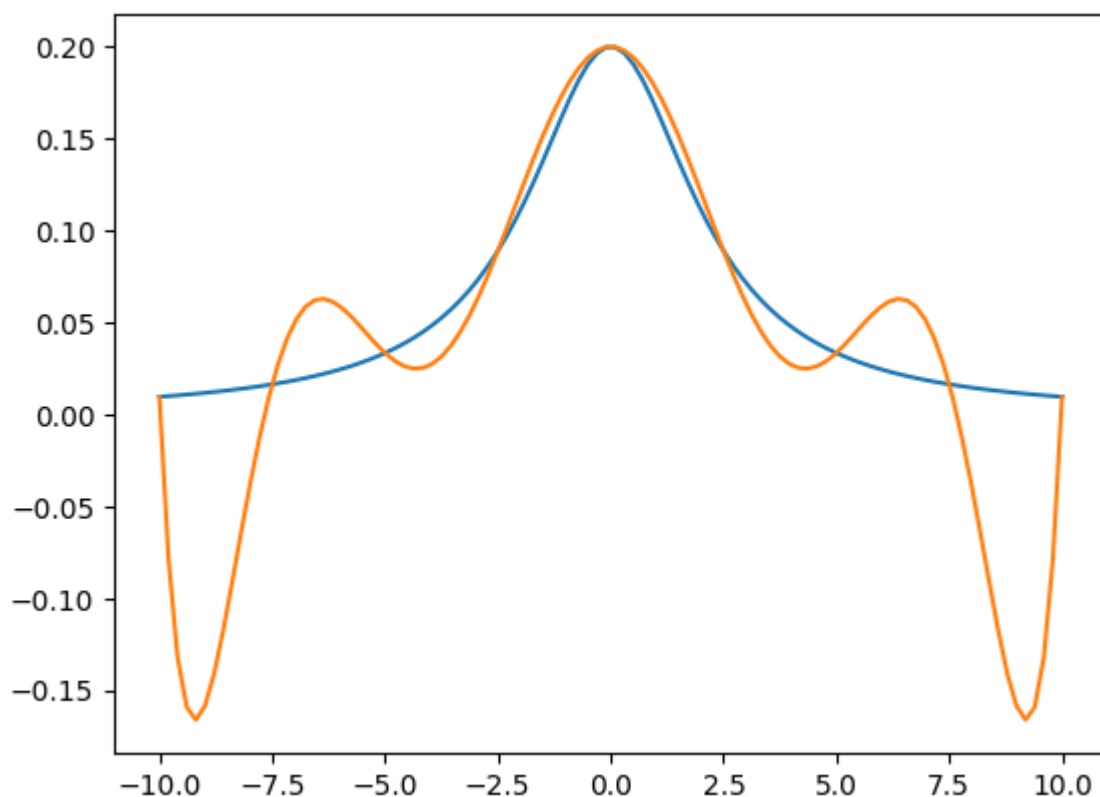
div_diff = newtons_divided_diff(even_inter_pts, f(even_inter_pts))

x = np.linspace(-10, 10, 100)
y = f(x)

even_space_y = nested_poly(8, div_diff, x, even_inter_pts)

plt.plot(x, y)
plt.plot(x, even_space_y)
plt.show()

```



(b)

First, define a function to return n Chebyshev nodes on $[a, b]$

```

In [23]: def chebyshev_nodes(a, b, n):

    k = np.arange(1, n+1)

    x_k = np.cos(np.pi*(2*k - 1)/(2*n))

    return 0.5*(b - a)*x_k + 0.5*(b + a)

```

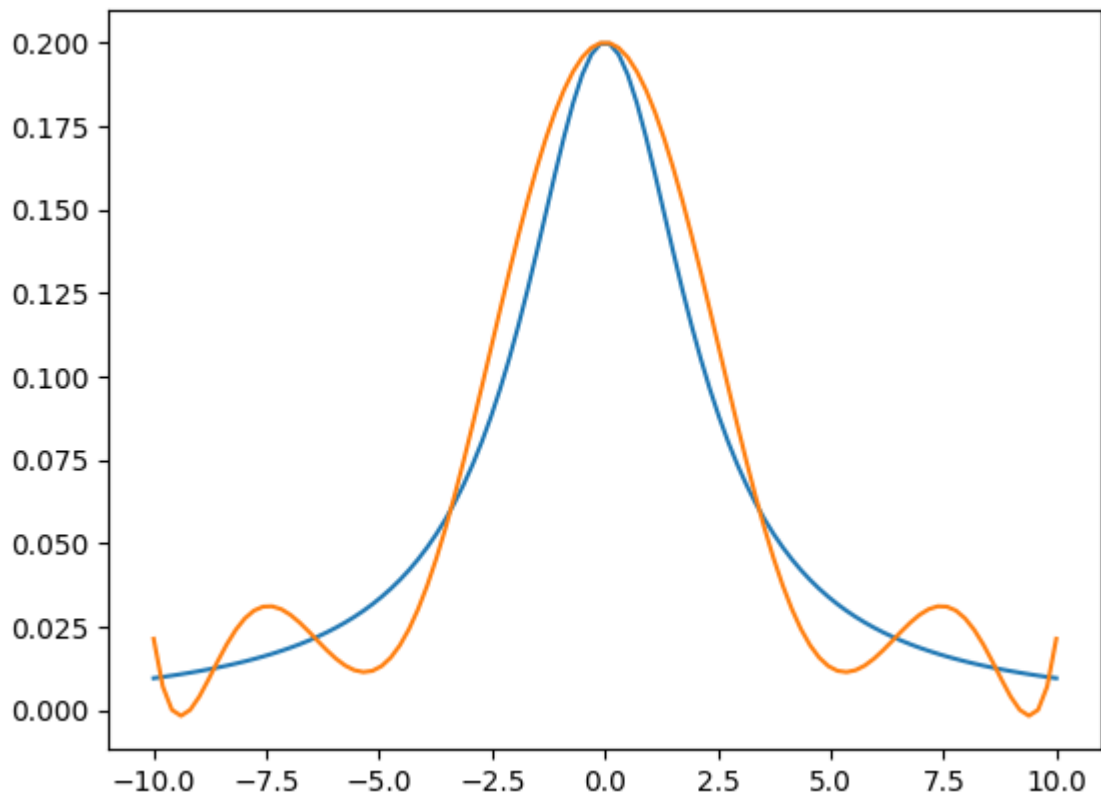
Interpolate using Chebyshev nodes

```
In [24]: cheb_inter_pts = chebyshev_nodes(-10, 10, 9)

div_diff = newtons_divided_diff(cheb_inter_pts, f(cheb_inter_pts))

chebyshev_y = nested_poly(8, div_diff, x, cheb_inter_pts)

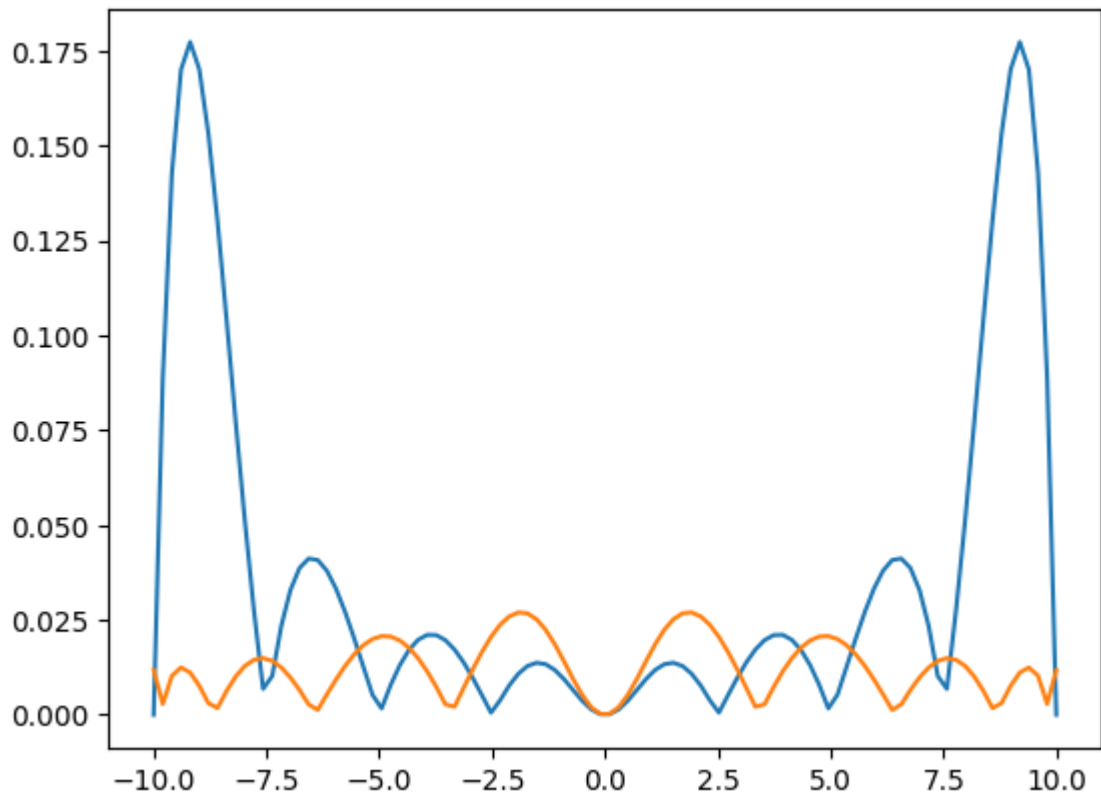
plt.plot(x, y)
plt.plot(x, chebyshev_y)
plt.show()
```



(c)

Compute and display error of both interpolations

```
In [26]: even_error = np.abs(y - even_space_y)
cheb_error = np.abs(y - chebyshev_y)
plt.plot(x, even_error)
plt.plot(x, cheb_error)
plt.show()
```



2.

Create an array with oil consumption data:

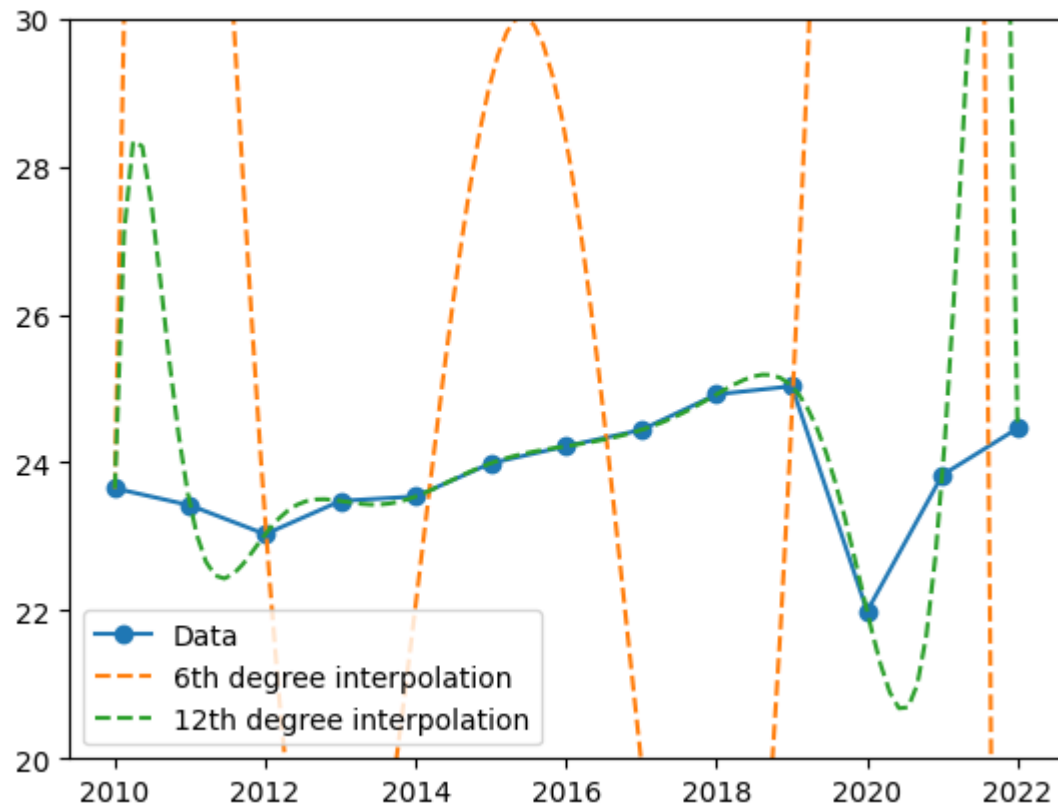
```
In [12]: annual_us_oil = np.array(
    [[2010, 23.65],
     [2011, 23.42],
     [2012, 23.03],
     [2013, 23.48],
     [2014, 23.54],
     [2015, 23.99],
     [2016, 24.22],
     [2017, 24.44],
     [2018, 24.92],
     [2019, 25.03],
     [2020, 21.99],
     [2021, 23.83],
     [2022, 24.46]])
```

Plot the data and two interpolations

```
In [5]: div_diff = newtons_divided_diff(annual_us_oil[:,0], annual_us_oil[:,1])

y_6 = nested_poly(6, div_diff, np.linspace(2010, 2022, 100), annual_us_
y_12 = nested_poly(12, div_diff, np.linspace(2010, 2022, 100), annual_u

plt.plot(annual_us_oil[:,0], annual_us_oil[:,1], marker='o', label='Data')
plt.plot(np.linspace(2010, 2022, 100), y_6, linestyle='dashed', label='6th degree interpolation')
plt.plot(np.linspace(2010, 2022, 100), y_12, linestyle='dashed', label='12th degree interpolation')
plt.ylim((20, 30))
plt.legend()
plt.show()
```



The 6th degree interpolation is not useful at all. The 12th degree interpolation is pretty good from 2012 to 2020

3.

Define a function to return the three point centered difference for given function and parameter h as a function of x

```
In [6]: def three_pt_centered(f, h):
        def df(x):
            return (f(x+h) - f(x-h))/(2*h)
        return df
```

```
In [7]: def f(x): return np.exp(x)
```

Plot the error for different h values

```
In [8]: results = []

for i in range(10):

    h = 10**(-(i+1))

    df = three_pt_centered(f, h)

    results.append([h, df(0)])

results = np.array(results)
error = np.abs(results[:,1] - 1)

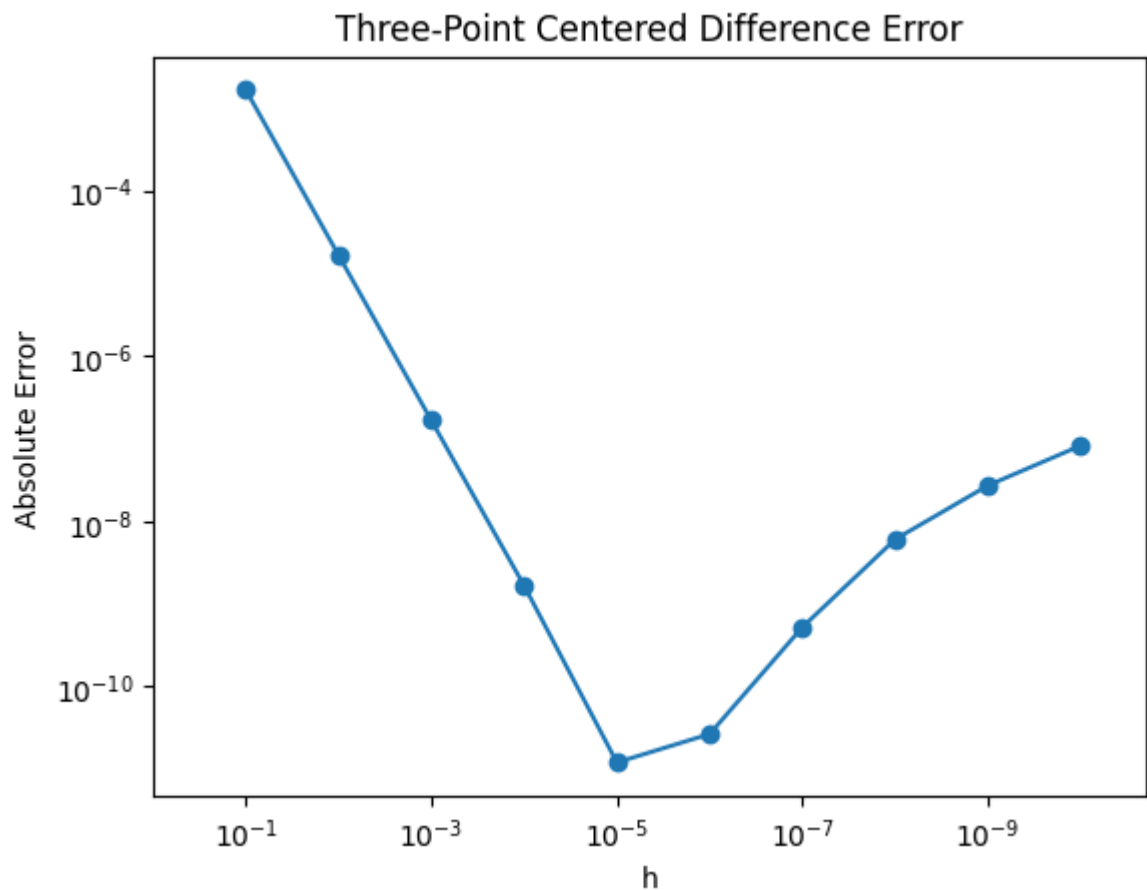
plt.plot(results[:,0], error, marker='o')

plt.semilogx() # log scale x
plt.semilogy() # log scale y

plt.xlim(1e0, 2e-11) # flip x-axis

plt.title('Three-Point Centered Difference Error')
plt.xlabel('h')
plt.ylabel('Absolute Error')

plt.show()
```



4.**(a)**

$$f(x+h) = f(x) + hf^{(1)}(x) + \frac{h^2}{2!}f^{(2)}(x) + \frac{h^3}{3!}f^{(3)}(x) + \frac{h^4}{4!}f^{(4)}(\xi(x))$$

$$f(x-h) = f(x) - hf^{(1)}(x) + \frac{h^2}{2!}f^{(2)}(x) - \frac{h^3}{3!}f^{(3)}(x) + \frac{h^4}{4!}f^{(4)}(\xi(x))$$

(b)

$$f(x+h) + f(x-h) = 2f(x) + h^2 f^{(2)}(x) + \frac{h^4}{6} f^{(4)}(\xi(x))$$

(c)

$$f^{(2)}(x) = \frac{f(x+h) + f(x-h)}{h^2} - \frac{2f(x)}{h^2} - \frac{h^2}{6} f^{(4)}(\xi(x))$$

This is a second-order, three point approximation.

5.

Define the above as a function which returns a function again

```
In [9]: def second_derivative(f, h=1e-5):
        def d2f(x):
            return (f(x + h) + f(x - h) - 2*f(x))/h**2
        return d2f
```

```
In [10]: def f(x): return np.sin(x)
```

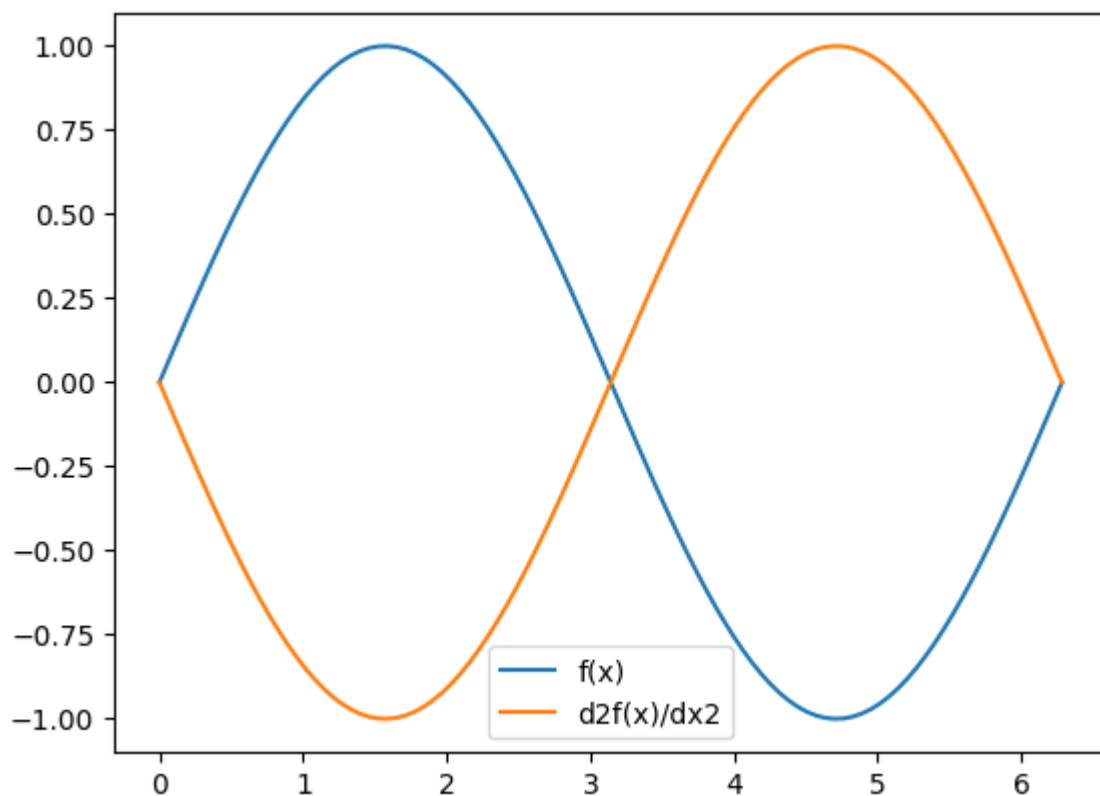
Plot $f(x)$ and $\frac{d^2 f}{dx^2}$


```
In [11]: d2f = second_derivative(f)

x = np.linspace(0, 2*np.pi, 100)

y = f(x)

d2y = d2f(x)
plt.plot(x, y, label='f(x)')
plt.plot(x, d2y, label='d2f(x)/dx2')
plt.legend()
plt.show()
```



In []: