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

```
In [2]: # analytical derivatives
                      # Main Function
                      def PMfun(M):
                                 g = 1.4
                                 np.seterr(divide= 'ignore', invalid='ignore')
                                 res = ((((g+1)/(g-1))**(1/2))*(np.arctan((((g-1)*((M**2)-1))/(g+1))**(1/2))))-(np.arctan((((g-1)*((M**2)-1))/(g+1))**(1/2))))
                                 return res
                      # First derivative
                      def dPMfun(M):
                                 g = 1.4
                                 return ((M*(g-1)*(((g+1)/(g-1))**(1/2)))/(((M**2)*(g-1))+2)*((((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1)/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1)/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1)/(((M**2)-1)*(g-1))/(((M**2)-1)*(g-1))/(((M**2)-1)*(((M**2)-1)*((M**2)-1))/(((M**2)-1)*((M**2)-1)/(((M**2)-1))/(((M**2)-1)*((M**2)-1)/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1))/(((M**2)-1)/(((M**2)-1))/(((M**2)-1))/(((M**2)-1)/(((M**2)-1))/(((M**2)-1)/(((M**2)-1))/(((M**2)-1)/(((M**2)-1))/(((M**2)-1)/(((M**2)-1)/(((M**2)-1)/(((M**2)-1)/(((M**2)-1)/(((M**2)-1)/(((M**2)-1)/
                      # Second Derivative
                      def d2PMfun(M):
                                 return ((((-10*(M**6))+(25*(M**4))+(10*(M**2))-25)/(((M**2)*(((M**2)-1)**(3/2)))*(
                      # First order derivatives
                      # Central First Derivative
                      def central(M, PMfun, h):
                                 return (((PMfun(M+h))-(PMfun(M-h)))/(2*h))
                      # Forward First Derivative
                      def forward(M, PMfun, h):
                                 return (((PMfun(M+h))-(PMfun(M)))/(h))
                      # Forward2 First Derivative
                      def forward2(M, PMfun, h):
                                 return (((-3*PMfun(M))+(4*PMfun(M+h))+(-1*PMfun(M+(2*h))))/(2*h))
                      # Backward First Derivative
                      def backward(M, PMfun, h):
                                 return (((PMfun(M))-(PMfun(M-h)))/(h))
                      # Second order derivatives
                      # Central Second Derivative
                      def centrald2(M, PMfun, h):
                                 return (((PMfun(M+h))-(2*PMfun(M))+(PMfun(M-h)))/(h**2))
                      # Forward Second Derivative
                      def forwardd2(M, PMfun, h):
                                 return (((PMfun(M))+(-2*PMfun(M+h))+(PMfun(M+(2*h))))/(h**2))
                      # Forward 2 Second Derivative
                      def forward2d2(M, PMfun, h):
                                 return (((2*PMfun(M))+(-5*PMfun(M+h))+(4*PMfun(M+(2*h)))+(-1*PMfun(M+(3*h))))/(h**]
```

```
# Backward Second Derivative
def backwardd2(M, PMfun, h):
    return (((PMfun(M))+(-2*PMfun(M-h))+(PMfun(M-(2*h))))/(h**2))
```

```
In [3]: # Making array to sotre M values
        M \text{ vals} = np.linspace(1,5,69)
        # true values
        org vals = PMfun(M vals)
        d1 = dPMfun(M vals)
        dd2 = d2PMfun(M vals)
        # numerical differences first derivative
        cent1 = central(M_vals, PMfun, 0.0001)
        for11 = forward(M_vals, PMfun, 0.0001)
         for21 = forward2(M vals, PMfun, 0.0001)
        # numerical differences second derivative
        cent2 = centrald2(M_vals, PMfun, 0.0001)
        for12 = forwardd2(M_vals, PMfun, 0.0001)
         for22 = forward2d2(M vals, PMfun, 0.0001)
In [4]: # plotting the graphs
        fig, ax = plt.subplots(2,3, figsize = (20,10))
         ax[0,0].plot(M_vals, cent1, 'ob', M_vals, d1, '--r')
        ax[0,0].set_title('Central vs First Derivative')
        ax[0,0].legend(['Central Method','Analytical Method'])
        ax[0,0].set_xlabel("Mach Number")
        \#ax[0,0]
        ax[0,1].plot(M_vals, for11, 'ob', M_vals, d1, '--r')
        ax[0,1].set title('Forward vs First Derivative')
        ax[0,1].legend(['Forward Method','Analytical Method'])
        ax[0,1].set xlabel("Mach Number")
        \#ax[0,1]
        ax[0,2].plot(M_vals, for21, 'ob', M_vals, d1, '--r')
         ax[0,2].set_title('Forward2 vs First Derivative')
        ax[0,2].legend(['Forward2 Method','Analytical Method'])
        ax[0,2].set xlabel("Mach Number")
        \#ax[0,2]
        ax[1,0].plot(M_vals, cent2, 'ob', M_vals, dd2, '--r')
        ax[1,0].set title('Central vs Second Derivative')
        ax[1,0].legend(['Central Method','Analytical Method'])
        ax[1,0].set_xlabel("Mach Number")
        \#ax[1,0]
        ax[1,1].plot(M_vals, for12, 'ob', M_vals, dd2, '--r')
        ax[1,1].set_title('Forward vs Second Derivative')
         ax[1,1].legend(['Forward Method','Analytical Method'])
        ax[1,1].set xlabel("Mach Number")
        \#ax[1,1]
```

```
ax[1,2].plot(M vals, for22, 'ob', M vals, dd2, '--r')
ax[1,2].set_title('Forward2 vs Second Derivative')
ax[1,2].legend(['Forward2 Method','Analytical Method'])
ax[1,2].set_xlabel("Mach Number")
\#ax[1,2]
plt.show()

    Central Method
    Analytical Method

    Forward Method
    Analytical Method

    Forward2 Method
    Analytical Method

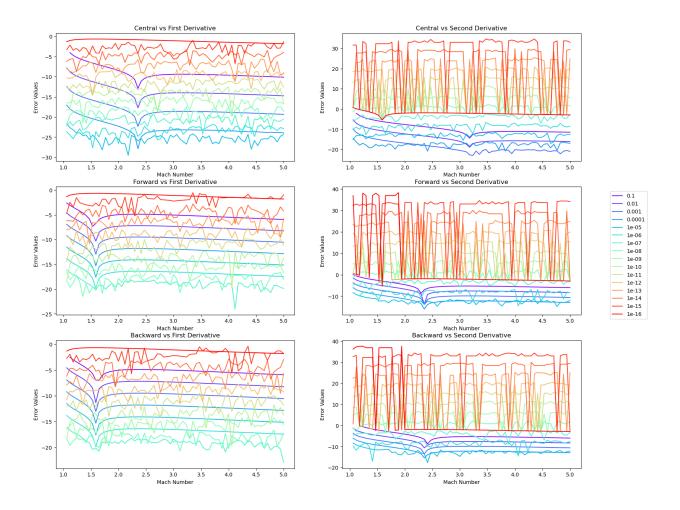
                                                         0.5
0.45
0.40
                                                         0.3
                                                                                                                  0.3
0.35
0.30
                                                         0.2
                                                                                                                  0.2
0.25
                                                         0.1
                                                                                                                  0.1
0.20
                                                         0.0
                                                                                                                  0.0
0.15
                   2.5
                        3.0
                             3.5
                                     4.0
                                                                                        3.5
                                                                                                   4.5
                                                                                                                                           3.0
                                                                                                                                                3.5
                                                                             2.5
                                                                                   3.0
                                                                                              4.0
                                                                                                                                      2.5
                                                                                                                                                       4.0
                      Mach Numbe
                                                                               Mach Numb
                                                                                                                                        Mach Number
               Central vs Second Derivative
                                                                       Forward vs Second Derivative
                                                                                                                                Forward2 vs Second Derivative
                                                                                         • Forward Method
--- Analytical Method
2.0

    Central Method
    Analytical Method

                                                                                                                                                  • Forward2 Method
--- Analytical Method
                                                          60
                                                                                                                   80
 1.5
                                                          40
1.0
                                                          20
 0.5
                                                                                                                   20
                                                          10
 0.0
                          3.0
                      Mach Number
                                                                               Mach Number
                                                                                                                                        Mach Number
```

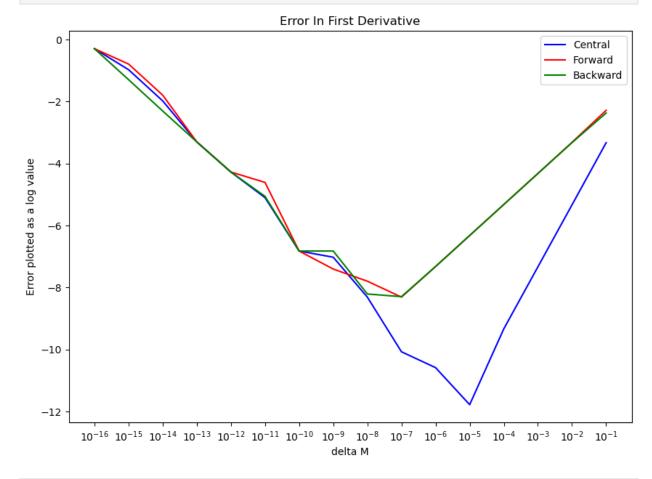
```
In [5]: # making array for delta M
        h = np.power(10, np.linspace(-1, -16, 16))
In [6]: # making empty lists
        cent1 = []
        cent2 = []
        for11 = []
        for12 = []
        bac11 = []
        bac12 = []
        # getting all the error values
        for i in h:
             # numerical differences first derivative
             cent1.append(np.log(abs((central(M vals, PMfun, i))-d1)))
            for11.append(np.log(abs((forward(M_vals, PMfun, i))-d1)))
             bac11.append(np.log(abs((backward(M_vals, PMfun, i))-d1)))
            # numerical differences second derivative
             cent2.append(np.log(abs((centrald2(M_vals, PMfun, i))-dd2)))
             for12.append(np.log(abs((forwardd2(M vals, PMfun, i))-dd2)))
             bac12.append(np.log(abs((backwardd2(M_vals, PMfun, i))-dd2)))
In [7]: # getting differnet colors for plotting purposes
        c = plt.cm.rainbow(np.linspace(0,1,16))
```

```
In [8]: # plotting
        fig, ax = plt.subplots(3,2, figsize = (18,15))
        ax[0,0].set_title('Central vs First Derivative')
        ax[0,0].set_xlabel('Mach Number')
        ax[0,0].set ylabel('Error Values')
        ax[1,0].set title('Forward vs First Derivative')
        ax[1,0].set xlabel('Mach Number')
        ax[1,0].set ylabel('Error Values')
        ax[2,0].set title('Backward vs First Derivative')
        ax[2,0].set xlabel('Mach Number')
        ax[2,0].set ylabel('Error Values')
        ax[0,1].set_title('Central vs Second Derivative')
        ax[0,1].set xlabel('Mach Number')
        ax[0,1].set ylabel('Error Values')
        ax[1,1].set title('Forward vs Second Derivative')
        ax[1,1].set_xlabel('Mach Number')
        ax[1,1].set ylabel('Error Values')
        ax[2,1].set_title('Backward vs Second Derivative')
        ax[2,1].set xlabel('Mach Number')
        ax[2,1].set_ylabel('Error Values')
        for i in range(0,16):
             ax[0,0].plot(M_vals, cent1[i], linestyle = '-', color = c[i], label = str(h[i]))
            #ax[0,0].set title('Central vs First Derivative')
             ax[1,0].plot(M vals, for11[i], linestyle = '-', color = c[i])
            #ax[0,1].set_title('Forward vs First Derivative')
            ax[2,0].plot(M vals, bac11[i], linestyle = '-', color = c[i])
            #ax[1,0].set title('Backward vs First Derivative')
            ax[0,1].plot(M_vals, cent2[i], linestyle = '-', color = c[i])
            #ax[1,1].set title('Central vs Second Derivative')
            ax[1,1].plot(M_vals, for12[i], linestyle = '-', color = c[i])
            #ax[2,0].set title('Forward vs Second Derivative')
            ax[2,1].plot(M vals, bac12[i], linestyle = '-', color = c[i])
             #ax[2,1].set title('Backward vs Second Derivative')
        fig.legend(loc = 'center right')
        plt.show()
```

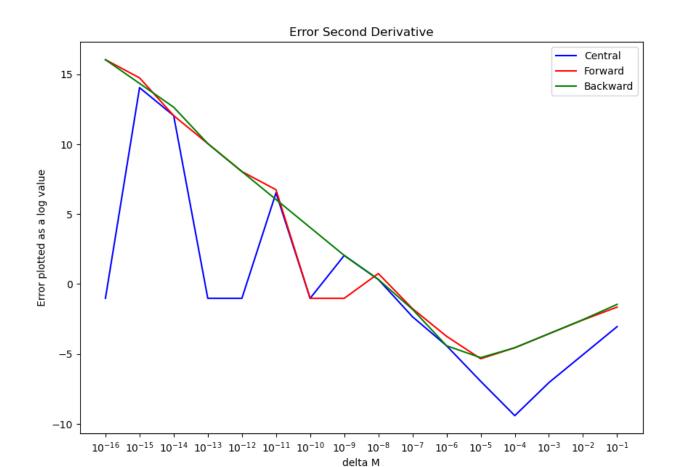


```
# true values at M = 1.8
In [9]:
         org_vals = PMfun(1.8)
         d1 = dPMfun(1.8)
         dd2 = d2PMfun(1.8)
         # numerical differences first derivative
         cent1 = np.log10(abs(central(1.8, PMfun, h) - d1))
         for11 = np.log10(abs(forward(1.8, PMfun, h) - d1))
         bac11 = np.log10(abs(backward(1.8, PMfun, h) - d1))
         # numerical differences second derivative
         cent2 = np.log10(abs(centrald2(1.8, PMfun, h) - dd2))
         for12 = np.log10(abs(forwardd2(1.8, PMfun, h) - dd2))
         bac12 = np.log10(abs(backwardd2(1.8, PMfun, h) - dd2))
         # plotting
In [10]:
         fig, ax = plt.subplots(figsize = (10,7))
         ax.plot(h, cent1, '-b' , label = 'Central')
         ax.plot(h, for11, '-r' , label = 'Forward')
         ax.plot(h, bac11, '-g' , label = 'Backward')
         ax.set_xscale('log')
         ax.set_xticks(h)
         ax.set_xlabel('delta M')
         ax.set_ylabel('Error plotted as a log value')
         ax.set title('Error In First Derivative')
         ax.legend()
```

plt.show()



```
In [11]: # plotting
fig, ax = plt.subplots(figsize = (10,7))
    ax.plot(h, cent2, '-b' , label = 'Central')
    ax.plot(h, for12, '-r' , label = 'Forward')
    ax.plot(h, bac12, '-g' , label = 'Backward')
    ax.set_xscale('log')
    ax.set_xticks(h)
    ax.set_xlabel('delta M')
    ax.set_ylabel('Error plotted as a log value')
    ax.set_title('Error Second Derivative')
    ax.legend()
```



The values for Δ M are specified below:

Id	Difference Type	Δ M
01	Central First Derivative	1e-5
02	Forward First Derivative	1e-7
03	Backward First Derivative	1e-7
04	Central Second Derivative	1e-4
05	Forward Second Derivative	1e-5
06	Backward Second Derivative	1e-5

Central Method gives the most accurate value for both first and second derivative and it gives those values at 1e-4 for second derivative and 1e-5 for first derivative.

We got these values from the graph above, as the lowest value that we got from the graph are the most accurate results of the differences method. It clearly gives massive errors of the scale of 1e15 when a Δ M of 1e-15 is taken for the second derivative tests. But at points 1e-5, we get error of the order 1e-5, which is a good estimate for our purposes, it is not the most accurate results, but decent enough to use them in computing values for difficult derivatives.