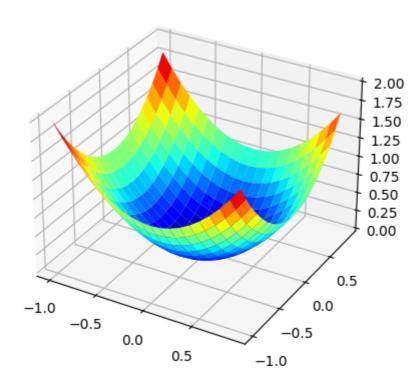
Gauray Kedia

```
In [12]: # 3d plot of the test function
         from numpy import arange
         from numpy import meshgrid
         from matplotlib import pyplot
         import matplotlib.pyplot as plt
         import numpy as np
         # objective function
         def objective(x, y):
               return x**2.0 + y**2.0
         # define range for input
         r_{min}, r_{max} = -1.0, 1.0
         # sample input range uniformly at 0.1 increments
         xaxis = arange(r_min, r_max, 0.1)
         yaxis = arange(r_min, r_max, 0.1)
         # create a mesh from the axis
         x, y = meshgrid(xaxis, yaxis)
         # compute targets
         results = objective(x, y)
         # create a surface plot with the jet color scheme
         figure = plt.figure()
         axis = figure.add_subplot(projection='3d')
         axis.plot_surface(x, y, results, cmap='jet')
         # show the plot
         pyplot.show()
         # print(np.shape(xaxis))
         print(results)
         # print(xaxis)
         # print(y)
```



```
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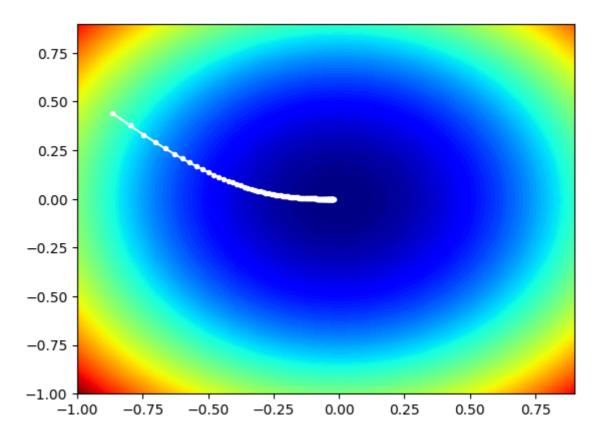
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        1.17000000e+00 1.30000000e+00 1.45000000e+00 1.62000000e+00]]
In [6]: # gradient descent optimization with adagrad for a two-dimensional test function
        from math import sqrt
        from numpy import asarray
        from numpy.random import rand
        from numpy.random import seed
        from numpy import arange
        from numpy import meshgrid
        from matplotlib import pyplot
        from mpl_toolkits.mplot3d import Axes3D
        import numpy as np
        # derivative of objective function
        def derivative(x, y):
            return asarray([x * 2.0, y * 2.0])
        # gradient descent algorithm with adagrad
        def adagrad(objective, derivative, bounds, n_iter, step_size):
            solutions = list()
```

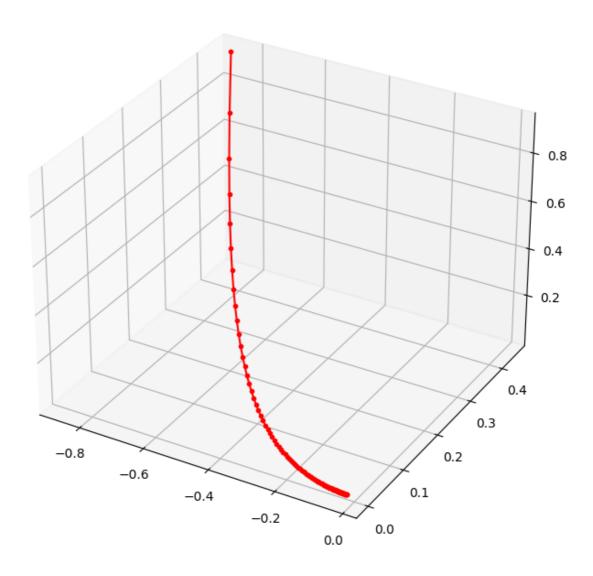
```
score=list()
    solution = bounds[:, 0] + rand(len(bounds)) * (bounds[:, 1] - bounds[:, 0])
    solution=np.array([-0.96595599, 0.54064899])
    sq_grad_sums = [0.0 for _ in range(bounds.shape[0])]
    for it in range(n iter):
        gradient = derivative(solution[0], solution[1])
        for i in range(gradient.shape[0]):
            sq_grad_sums[i] += gradient[i]**2.0
        new_solution = list()
        for i in range(solution.shape[0]):
            alpha = step_size / (1e-8 + sqrt(sq_grad_sums[i]))
            value = solution[i] - alpha * gradient[i]
            new_solution.append(value)
        solution = asarray(new_solution)
        solutions.append(solution)
        solution eval = objective(solution[0], solution[1])
        print('>%d f(%s) = %.5f' % (it, solution, solution_eval))
        score.append(solution eval)
    return [solutions, score]
seed(1)
bounds = asarray([[-1.0, 1.0], [-1.0, 1.0]])
n iter = 100
step_size = 0.1
solution, score = adagrad(objective, derivative, bounds, n iter, step size)
# print('Done!')
# print('f(%s) = f(%s)' % (solution, score))
xaxis = arange(r min, r max, 0.1)
yaxis = arange(r_min, r_max, 0.1)
x, y = meshgrid(xaxis, yaxis)
results = objective(x, y)
pyplot.contourf(x, y, results, levels=100, cmap='jet')
solutions = asarray(solution)
# print(solutions[:, 0])
# print(solutions[:, 1])
pyplot.plot(solutions[:, 0], solutions[:, 1], '.-', color='w')
pyplot.show()
# print(score)
figure = pyplot.figure(figsize=(10, 8))
axis = figure.add_subplot(projection='3d')
# axis.plot_surface(x, y, results, cmap='jet')
solutions = asarray(solutions)
pyplot.plot(solutions[:, 0], solutions[:, 1],score, '.-', color='r')
pyplot.show()
figure = pyplot.figure(figsize=(10, 8))
axis = figure.add_subplot(projection='3d')
axis.plot_surface(x, y, results, cmap='jet', alpha=0.8)
```

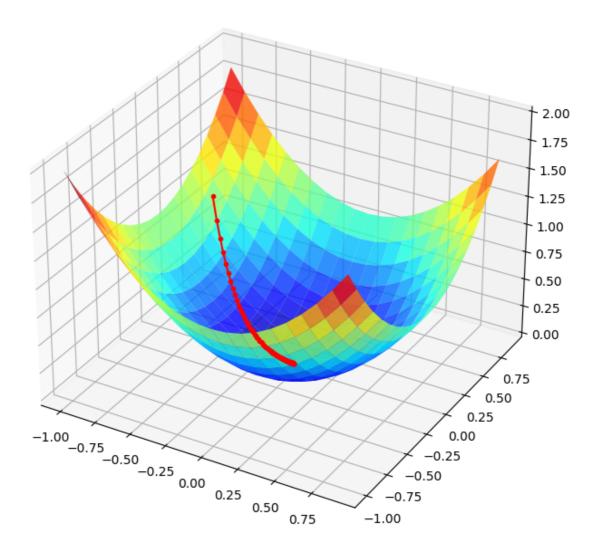
```
solutions = asarray(solutions)
pyplot.plot(solutions[:, 0], solutions[:, 1],score, '.-', color='r', zorder=10)
pyplot.show()
```

[-0.96595599 0.54064899] >0 f([-0.86595599 0.44064899]) = 0.94405 >1 f([-0.79920463 0.37747134]) = 0.78121 >2 f([-0.74675325 0.32987503]) = 0.66646 >3 f([-0.70274519 0.29147005]) = 0.57881 >4 f([-0.66448221 0.25933601]) = 0.50879 >5 f([-0.63046077 0.23184622]) = 0.45123 >6 f([-0.59974197 0.20798051]) = 0.40295 >7 f([-0.57169298 0.18704587]) = 0.36182 >8 f([-0.54586313 0.16854351]) = 0.32637 >9 f([-0.5219178 0.15209838]) = 0.29553 >10 f([-0.49960032 0.1374186]) = 0.26848 >11 f([-0.47870856 0.12427078]) = 0.24461>12 f([-0.45907986 0.11246407]) = 0.22340 >13 f([-0.44058089 0.10183956]) = 0.20448 >14 f([-0.42310069 0.09226298]) = 0.18753 >15 f([-0.40654566 0.08361941]) = 0.17227 >16 f([-0.39083591 0.07580953]) = 0.15850 >17 f([-0.37590256 0.06874675]) = 0.14603 >18 f([-0.36168569 0.06235508]) = 0.13470>19 f([-0.34813273 0.05656739]) = 0.12440 >20 f([-0.33519721 0.05132412]) = 0.11499 >21 f([-0.32283784 0.04657222]) = 0.10639 >22 f([-0.31101762 0.04226429]) = 0.09852 >23 f([-0.29970331 0.03835783]) = 0.09129 >24 f([-0.28886482 0.03481466]) = 0.08465 >25 f([-0.27847484 0.03160045]) = 0.07855 >26 f([-0.26850844 0.02868422]) = 0.07292 >27 f([-0.25894279 0.02603804]) = 0.06773 >28 f([-0.24975692 0.02363667]) = 0.06294 >29 f([-0.24093149 0.02145729]) = 0.05851>30 f([-0.2324486 0.01947924]) = 0.05441 >31 f([-0.22429165 0.01768382]) = 0.05062 >32 f([-0.21644521 0.01605411]) = 0.04711 >33 f([-0.20889488 0.01457475]) = 0.04385>34 f([-0.20162719 0.01323183]) = 0.04083 >35 f([-0.19462956 0.01201274]) = 0.03802>36 f([-0.18789014 0.01090604]) = 0.03542 >37 f([-0.18139781 0.00990134]) = 0.03300>38 f([-0.17514209 0.00898924]) = 0.03076>39 f([-0.1691131 0.00816119]) = 0.02867>40 f([-0.16330148 0.00740943]) = 0.02672 >41 f([-0.1576984 0.00672694]) = 0.02491 >42 f([-0.15229547 0.00610733]) = 0.02323 >43 f([-0.14708474 0.0055448]) = 0.02166 >44 f([-0.14205866 0.00503408]) = 0.02021>45 f([-0.13721003 0.00457041]) = 0.01885 >46 f([-0.13253201 0.00414946]) = 0.017580.00376727]) = 0.01640>47 f([-0.1280181 >48 f([-0.12366206 0.00342029]) = 0.01530 >49 f([-0.11945796 0.00310527]) = 0.01428 >50 f([-0.11540014 0.00281927]) = 0.01333 >51 f([-0.11148316 0.00255961]) = 0.01244 >52 f([-0.10770184 0.00232386]) = 0.01161 >53 f([-0.10405121 0.00210983]) = 0.01083 >54 f([-0.10052651 0.00191551]) = 0.01011 >55 f([-0.09712319 0.00173909]) = 0.00944 >56 f([-0.09383686 0.00157892]) = 0.00881 >57 f([-0.09066333 0.0014335]) = 0.00822 >58 f([-0.08759856 0.00130147]) = 0.00768

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```







In []: