

1 实现Gradient Descent

In [6]:

```
x_data = [338., 333., 328., 207., 226., 25., 179., 60., 208., 606.]
y_data = [640., 633., 619., 393., 428., 27., 193., 60., 226., 1591.]
# ydata = b+ w* xdata
print("x_data: ", x_data, len(x_data))
print("y_data: ", y_data)
```

```
x_data: [338.0, 333.0, 328.0, 207.0, 226.0, 25.0, 179.0, 60.0, 208.0, 606.0] 10
y_data: [640.0, 633.0, 619.0, 393.0, 428.0, 27.0, 193.0, 60.0, 226.0, 1591.0]
```

In [2]:

```
import numpy as np

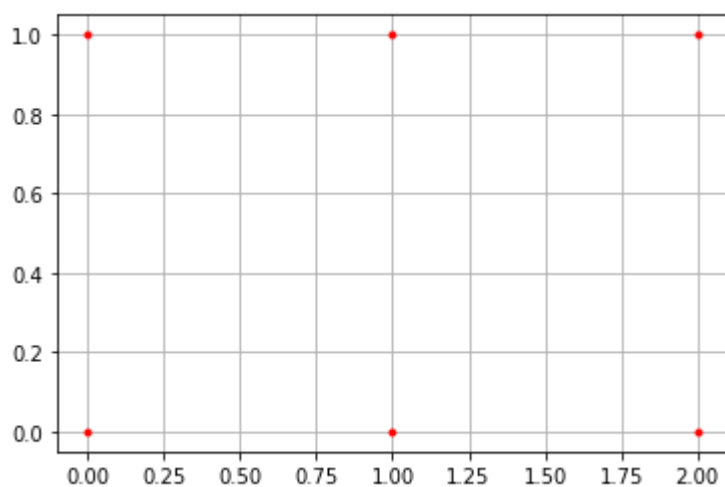
x = np.arange(-200, -100, 1) # bias
y = np.arange(-5, 5, 0.1) # weights
X, Y = np.meshgrid(x, y)
```

1.1 解释 np.meshgrid的作用

In [1]:

```
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
x = np.array([[0, 1, 2], [0, 1, 2]])
y = np.array([[0, 0, 0], [1, 1, 1]])

plt.plot(x, y,
         color='red', # 全部点设置为红色
         marker='.', # 点的形状为圆点
         linestyle='') # 线型为空, 也即点与点之间不用线连接
plt.grid(True)
plt.show()
```



语法: $X, Y = \text{np.meshgrid}(x, y)$

输入 x, y 就是网格点的横纵坐标列向量(非矩阵)

输出的 x, y ,就是坐标矩阵

In [7]:

```

import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline

x = np.array([0, 1, 2])
y = np.array([0, 1])

X, Y = np.meshgrid(x, y)
print(X, '\n', Y)
plt.plot(X, Y,
         color='red', # 全部点设置为红色
         marker='.', # 点的形状为圆点
         linestyle='') # 线型为空, 也即点与点之间不用线连接
plt.grid(True)
plt.show()

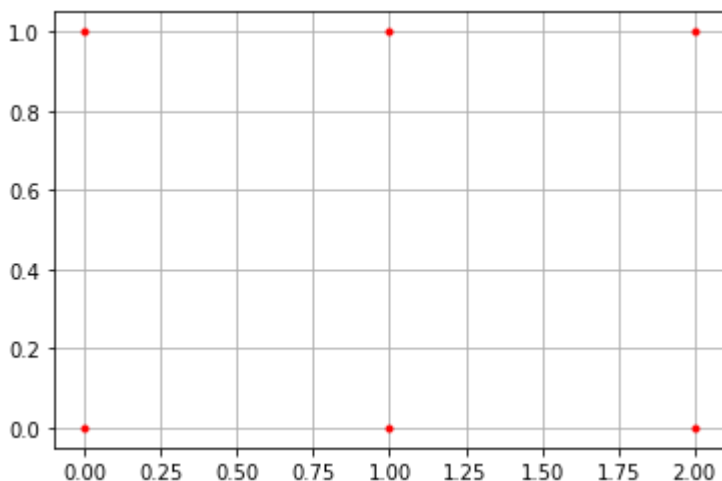
x = np.linspace(0, 1000, 20)
y = np.linspace(0, 500, 20)
print(x, '\n', y)
X, Y = np.meshgrid(x, y)
plt.plot(X, Y,
         marker='.',
         linestyle='')
plt.grid(True)
plt.show()

```

```

[[0 1 2]
 [0 1 2]]
[[0 0 0]
 [1 1 1]]

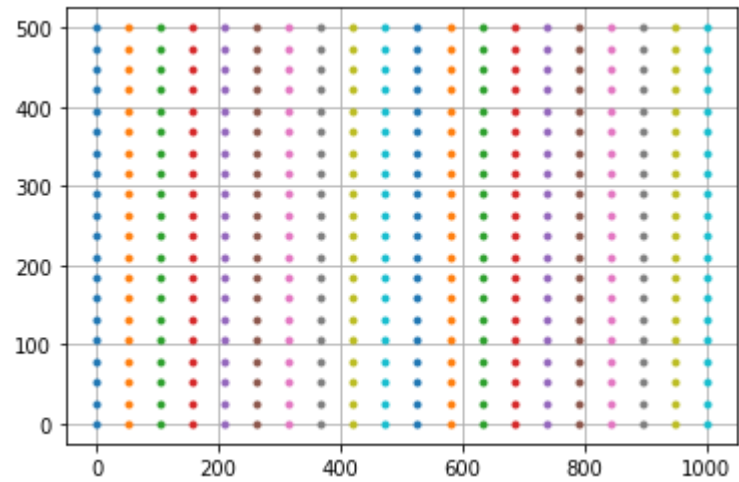
```



```

[  0.          52.63157895 105.26315789 157.89473684 210.52631579
 263.15789474 315.78947368 368.42105263 421.05263158 473.68421053
 526.31578947 578.94736842 631.57894737 684.21052632 736.84210526
 789.47368421 842.10526316 894.73684211 947.36842105 1000.         ]
[  0.          26.31578947 52.63157895 78.94736842 105.26315789
 131.57894737 157.89473684 184.21052632 210.52631579 236.84210526
 263.15789474 289.47368421 315.78947368 342.10526316 368.42105263
 394.73684211 421.05263158 447.36842105 473.68421053 500.         ]

```



1.2 继续实现 Gradient Descent

In [11]:

```

import numpy as np
x_data = [338., 333., 328., 207., 226., 25., 179., 60., 208., 606.]
y_data = [640., 633., 619., 393., 428., 27., 193., 60., 226., 1591.]
# ydata = b+ w*xdata
# print("x_data: ", x_data, len(x_data))
# print("y_data: ", y_data)

x = np.arange(-200, -100, 1) # bias
y = np.arange(-5, 5, 0.1) # weights
print(x, '\n', y, len(x), len(y))
X, Y = np.meshgrid(x, y)
print(X, '\n', Y)
plt.plot(X, Y,
         marker='.',
         linestyle='')
plt.grid(True)
plt.show()

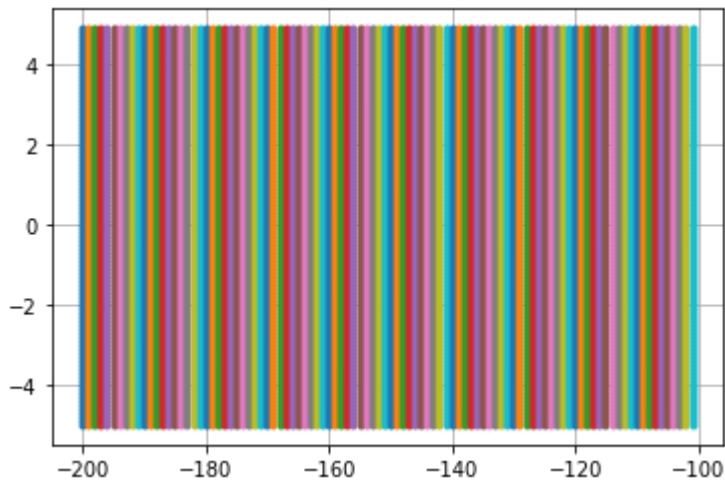
[-200 -199 -198 -197 -196 -195 -194 -193 -192 -191 -190 -189 -188 -187
 -186 -185 -184 -183 -182 -181 -180 -179 -178 -177 -176 -175 -174 -173
 -172 -171 -170 -169 -168 -167 -166 -165 -164 -163 -162 -161 -160 -159
 -158 -157 -156 -155 -154 -153 -152 -151 -150 -149 -148 -147 -146 -145
 -144 -143 -142 -141 -140 -139 -138 -137 -136 -135 -134 -133 -132 -131
 -130 -129 -128 -127 -126 -125 -124 -123 -122 -121 -120 -119 -118 -117
 -116 -115 -114 -113 -112 -111 -110 -109 -108 -107 -106 -105 -104 -103
 -102 -101]
[-5.00000000e+00 -4.90000000e+00 -4.80000000e+00 -4.70000000e+00
 -4.60000000e+00 -4.50000000e+00 -4.40000000e+00 -4.30000000e+00
 -4.20000000e+00 -4.10000000e+00 -4.00000000e+00 -3.90000000e+00
 -3.80000000e+00 -3.70000000e+00 -3.60000000e+00 -3.50000000e+00
 -3.40000000e+00 -3.30000000e+00 -3.20000000e+00 -3.10000000e+00
 -3.00000000e+00 -2.90000000e+00 -2.80000000e+00 -2.70000000e+00
 -2.60000000e+00 -2.50000000e+00 -2.40000000e+00 -2.30000000e+00
 -2.20000000e+00 -2.10000000e+00 -2.00000000e+00 -1.90000000e+00
 -1.80000000e+00 -1.70000000e+00 -1.60000000e+00 -1.50000000e+00
 -1.40000000e+00 -1.30000000e+00 -1.20000000e+00 -1.10000000e+00
 -1.00000000e+00 -9.00000000e-01 -8.00000000e-01 -7.00000000e-01
 -6.00000000e-01 -5.00000000e-01 -4.00000000e-01 -3.00000000e-01
 -2.00000000e-01 -1.00000000e-01 -1.77635684e-14 1.00000000e-01
 2.00000000e-01 3.00000000e-01 4.00000000e-01 5.00000000e-01
 6.00000000e-01 7.00000000e-01 8.00000000e-01 9.00000000e-01
 1.00000000e+00 1.10000000e+00 1.20000000e+00 1.30000000e+00
 1.40000000e+00 1.50000000e+00 1.60000000e+00 1.70000000e+00
 1.80000000e+00 1.90000000e+00 2.00000000e+00 2.10000000e+00
 2.20000000e+00 2.30000000e+00 2.40000000e+00 2.50000000e+00
 2.60000000e+00 2.70000000e+00 2.80000000e+00 2.90000000e+00
 3.00000000e+00 3.10000000e+00 3.20000000e+00 3.30000000e+00
 3.40000000e+00 3.50000000e+00 3.60000000e+00 3.70000000e+00
 3.80000000e+00 3.90000000e+00 4.00000000e+00 4.10000000e+00
 4.20000000e+00 4.30000000e+00 4.40000000e+00 4.50000000e+00
 4.60000000e+00 4.70000000e+00 4.80000000e+00 4.90000000e+00] 100 100
[[-200 -199 -198 ... -103 -102 -101]
 [-200 -199 -198 ... -103 -102 -101]
 [-200 -199 -198 ... -103 -102 -101]
 ...
 [-200 -199 -198 ... -103 -102 -101]
 [-200 -199 -198 ... -103 -102 -101]
 [-200 -199 -198 ... -103 -102 -101]]
[[-5. -5. -5. ... -5. -5. -5. ]

```

```

[-4.9 -4.9 -4.9 ... -4.9 -4.9 -4.9]
[-4.8 -4.8 -4.8 ... -4.8 -4.8 -4.8]
...
[ 4.7  4.7  4.7 ...  4.7  4.7  4.7]
[ 4.8  4.8  4.8 ...  4.8  4.8  4.8]
[ 4.9  4.9  4.9 ...  4.9  4.9  4.9]]

```



In [15]:

```

import numpy as np
x_data = [338., 333., 328., 207., 226., 25., 179., 60., 208., 606.]
y_data = [640., 633., 619., 393., 428., 27., 193., 60., 226., 1591.]
# ydata = b+ w* xdata
print("x_data: ", x_data, len(x_data))
print("y_data: ", y_data)

x = np.arange(-200, -100, 1) # bias 100
y = np.arange(-5, 5, 0.1) # weights 100
z = np.zeros((len(x), len(y))) # 100*100
X, Y = np.meshgrid(x, y)
for i in range(len(x)):
    for j in range(len(y)):
        b = x[i]
        w = y[j]
        z[j][i] = 0
        for n in range(len(x_data)):
            z[j][i] = z[j][i] + (y_data[n] - b - w*x_data[n]) ** 2
        z[j][i] = z[j][i] / len(x_data)

```

```

x_data: [338.0, 333.0, 328.0, 207.0, 226.0, 25.0, 179.0, 60.0, 208.0, 606.0] 10
y_data: [640.0, 633.0, 619.0, 393.0, 428.0, 27.0, 193.0, 60.0, 226.0, 1591.0]

```

In [34]:

```

# y_data = b + w*x_data
b = -120
w = -4
lr = 0.000001
iteration = 1000000

b_history = [b]
w_history = [w]

lr_b = 0
lr_w = 0

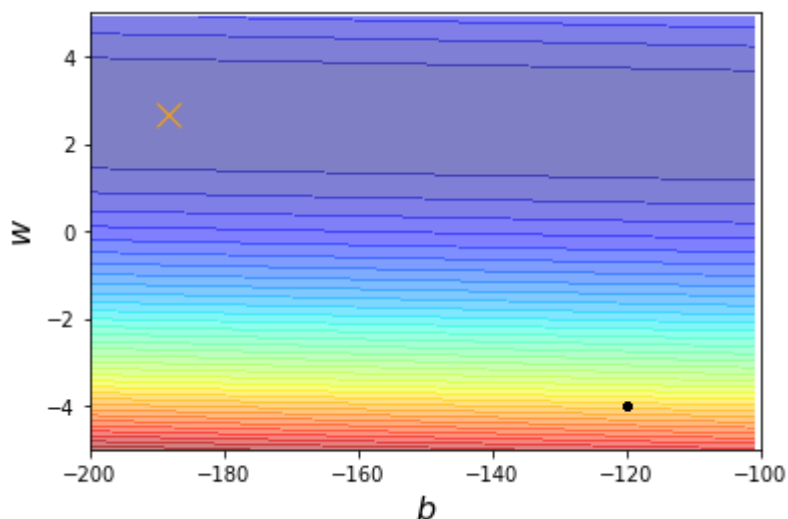
for i in range(iteration):
    b_grad = 0.0
    w_grad = 0.0
    for n in range(len(x_data)):
        b_grad = b_grad - 2.0*(y_data[n] - b - w*x_data[n]) * 1.0
        w_grad = w_grad - 2.0*(y_data[n] - b - w*x_data[n])*x_data[n]
    # Adagrad
    lr_b = lr_b + b_grad ** 2
    lr_w = lr_w + w_grad ** 2

    b = b - lr/np.sqrt(lr_b) * b_grad
    w = w - lr/np.sqrt(lr_w) * w_grad
#     b = b - lr * b_grad
#     w = w - lr * w_grad

    b_history.append(b)
    w_history.append(w)

plt.contourf(x, y, z, 50, alpha=0.5, cmap=plt.get_cmap('jet'))
plt.plot([-188.4], [2.67], 'x', ms=12, lw=1.5, color='orange')
plt.plot(b_history, w_history, 'o-', ms=3, lw=1.5, color='black')
plt.xlim(-200, -100)
plt.ylim(-5, 5)
plt.xlabel(r'$b$', fontsize=16)
plt.ylabel(r'$w$', fontsize=16)
plt.show()

```



In []: