matlab代码:

```
1 clear; clc;
2
   m = 100; n = 500; s = 50;
 3
 4
   A = randn(m,n);
   xs = zeros(n,1); picks=randperm(n); xs(picks(1:s)) = randn(s,1);
 5
 6
   b = A*xs;tau=0.001;
 7
 8
   cvx_begin
 9
        variable x(n)
10
        minimize 1/2*square_pos(norm(A*x-b))+tau*norm(x,1)
11
   cvx_end
12
13
    f = Q(x) \frac{1}{2} \operatorname{square\_pos}(\operatorname{norm}(A^*x-b)) + \operatorname{tau*norm}(x,1);
14
15
   % constant step size
   x = zeros(n,1); alpha = 0.0001;
16
   for k = 1 : 10000
17
18
        funcv = f(x);
19
        funcv_diff_const_step_size_1(k) = funcv-cvx_optval;
        % 计算在x点处的一个次梯度
20
21
        subgd = A'*(A*x-b)+tau*sign(x);
22
        % 更新x
23
        x = x-alpha*subgd;
24
    end
25
26
   x = zeros(n,1); alpha = 0.0005;
27
    for k = 1 : 10000
28
        funcv = f(x);
29
        funcv_diff_const_step_size_2(k) = funcv-cvx_optval;
        % 计算在x点处的一个次梯度
30
31
        subgd = A'*(A*x-b)+tau*sign(x);
32
        % 更新x
33
        x = x-alpha*subgd;
34
   end
35
36
    x = zeros(n,1); alpha = 0.001;
    for k = 1 : 10000
37
38
        funcv = f(x);
39
        funcv_diff_const_step_size_3(k) = funcv-cvx_optval;
40
        % 计算在x点处的一个次梯度
        subgd = A'*(A*x-b)+tau*sign(x);
41
42
        % 更新x
43
        x = x-alpha*subgd;
44
    end
45
46
   % constant step length
47
    x = zeros(n,1); gamma = 0.0005;
   for k = 1 : 10000
48
49
        funcv = f(x);
50
        funcv_diff_const_step_len_1(k) = funcv-cvx_optval;
51
        % 计算在x点处的一个次梯度
52
        subgd = A'*(A*x-b)+tau*sign(x);
```

```
53 % 更新x
54
         x = x-gamma/norm(subgd)*subgd;
55
     end
56
57
     x = zeros(n,1); gamma = 0.001;
58
    for k = 1 : 10000
59
        funcv = f(x);
60
        funcv_diff_const_step_len_2(k) = funcv-cvx_optval;
61
        % 计算在x点处的一个次梯度
        subgd = A'*(A*x-b)+tau*sign(x);
62
        % 更新x
63
64
        x = x-gamma/norm(subgd)*subgd;
     end
65
66
67
     x = zeros(n,1); gamma = 0.005;
68
    for k = 1 : 10000
69
        funcv = f(x);
        funcv_diff_const_step_len_3(k) = funcv-cvx_optval;
70
        % 计算在x点处的一个次梯度
71
72
        subgd = A'*(A*x-b)+tau*sign(x);
73
        % 更新x
74
        x = x-gamma/norm(subgd)*subgd;
    end
75
76
77
    % diminishing step size
78
    x = zeros(n,1);
    for k = 1 : 10000
79
80
        funcv = f(x);
        funcv_diff_dimi_step_size_1(k) = funcv-cvx_optval;
81
        % 计算在x点处的一个次梯度
82
83
        subgd = A'*(A*x-b)+tau*sign(x);
84
        % 更新x
85
        x = x-0.0005/sqrt(k)*subgd;
86
    end
87
88
    x = zeros(n,1);
89
    for k = 1 : 10000
90
        funcv = f(x);
        funcv_diff_dimi_step_size_2(k) = funcv-cvx_optval;
91
92
       % 计算在x点处的一个次梯度
93
        subgd = A'*(A*x-b)+tau*sign(x);
        % 更新x
94
        x = x-0.001/sqrt(k)*subgd;
95
96
    end
97
    x = zeros(n,1);
98
    for k = 1 : 10000
99
100
        funcv = f(x);
101
         funcv_diff_dimi_step_size_3(k) = funcv-cvx_optval;
        % 计算在x点处的一个次梯度
102
        subgd = A'*(A*x-b)+tau*sign(x);
103
104
        % 更新x
        x = x-0.001/k*subgd;
105
106
    end
107
108
    % Polyak's step size
```

```
109 \mid x = zeros(n,1);
  110
      for k = 1 : 10000
  111
           funcv = f(x);
  112
           funcv_diff_poly_step_size(k) = funcv-cvx_optval;
  113
           % 计算在x点处的一个次梯度
  114
           subgd = A'*(A*x-b)+tau*sign(x);
  115
           % 更新x
  116
           x = x-(funcv-cvx_optval)/sum_square(subgd)*subgd;
  117
       end
  118
  119
       figure;
       semilogy(funcv_diff_const_step_size_1, 'DisplayName', 'alpha(k)=0.0001',
  120
       'LineWidth', 1.5);
  121
       hold on
  122
       semilogy(funcv_diff_const_step_size_2, 'DisplayName', 'alpha(k)=0.0005',
       'LineWidth', 1.5);
       semilogy(funcv_diff_const_step_size_3, 'DisplayName', 'alpha(k)=0.001',
  123
       'LineWidth', 1.5);
  124
       xlabel('Iteration');
  125
      ylabel('f(xk)-f*');
  126
       legend:
      hold off;
  127
  128
  129
      figure;
  130
       semilogy(funcv_diff_const_step_len_1, 'DisplayName',
       'alpha(k)=0.0005/norm(subgrad)', 'Linewidth', 1.5);
  131
       hold on;
       semilogy(funcv_diff_const_step_len_2, 'DisplayName',
  132
       'alpha(k)=0.001/norm(subgrad)', 'LineWidth', 1.5);
  133
       semilogy(funcv_diff_const_step_len_3, 'DisplayName',
       'alpha(k)=0.005/norm(subgrad)', 'LineWidth', 1.5);
  134
      xlabel('Iteration');
  135
       ylabel('f(xk)-f*');
  136
      legend;
       hold off;
  137
  138
  139
      figure;
  140
       semilogy(funcv_diff_dimi_step_size_1, 'DisplayName',
       'alpha(k)=0.0005/sqrt(k)', 'Linewidth', 1.5);
  141
       hold on;
  142
       semilogy(funcv_diff_dimi_step_size_2, 'DisplayName',
       'alpha(k)=0.001/sqrt(k)', 'LineWidth', 1.5);
       semilogy(funcv_diff_dimi_step_size_3, 'DisplayName', 'alpha(k)=0.001/k',
  143
       'LineWidth', 1.5);
  144
       xlabel('Iteration');
  145
       ylabel('f(xk)-f*');
  146
       legend;
  147
      hold off;
  148
  149
       figure;
  150
       semilogy(funcv_diff_poly_step_size, 'DisplayName', 'Polyak', 'LineWidth',
       1.5);
      xlabel('Iteration');
  151
       ylabel('f(xk)-f*');
  152
  153
      legend;
```

