

写 之 前 记 得 加 上

**clear;clc; !!!!!!!!!!!!!!!**

二分法:

```
function res = division_fun(f, a, b, e)
```

```
% f:函数指针
```

```
% a:区间左端点
```

```
% b:区间右端点
```

```
% e:精度
```

```
while abs(b - a) > e
```

```
    mid = f((a + b) / 2);
```

```
    if mid == 0
```

```
        res = (a + b) / 2;
```

```
        break
```

```
    elseif mid * f(a) < 0
```

```
        b = (a + b) / 2;
```

```
    elseif mid * f(b) > 0
```

```
        a = (a + b) / 2;
```

```
    end
```

```
end
```

```
res = (a + b) / 2;
```

```
end
```

不动点迭代法:

```
function res = fix_point_fun(f, x0, e)
```

```
% f:函数指针
```

```
% x0:迭代初值
```

```
% e:精度
```

```
x1 = f(x0);
```

```
while abs(x1 - x0) >= e
```

```
    x0 = x1;
```

```
    x1 = f(x0);
```

```
end
```

```
res = x1;
```

```
end
```

牛顿迭代法:

```
function res = newton_fun(f, x0, e)
```

```
% f:函数
```

```
% x0:初始迭代值
```

```
% e:精度
```

```
x1 = x0 - f(x0) / dif_fun(f, x0);
```

```
while abs(x1 - x0) >= e
```

```
    x0 = x1;
```

```
    x1 = x0 - f(x0) / dif_fun(f, x0);
```

```
end
```

```
res = x1;
```

```
end
```

牛顿下山法:

```
function res = newton_downhill_fun(f, x0, e)
```

```
% f:函数
```

```
% x0:初始迭代值
```

```
% e:精度
```

```
x1 = x0 - f(x0) / dif_fun(f, x0);
```

```
while abs(x1 - x0) >= e
```

```
    lambda = 1;
```

```
    while abs(f(x1)) >= abs(f(x0))
```

```
        lambda = lambda / 2;
```

```
        x1 = x0 - lambda * f(x0) / dif_fun(f,
```

```
x0);
```

```
    end
```

```
    lambda = 1;
```

```
    x0 = x1;
```

```
    x1 = x0 - lambda * f(x0) / dif_fun(f, x0);
```

```
end
```

```
res = x1;
```

```
end
```

牛顿插值:

```
function res = newton_interpolation_fun(X,  
Y)
```

```
% X:横坐标向量
```

```
% Y:纵坐标向量
```

```
ps = [];
```

```
n = length(X);
```

```
for i = 1:n
```

```
    ps = [ps; poly(X(i))];
```

```
end
```

```
T = Y;
```

```
for i = 1:n-1
```

```
    ls = zeros(1, n);
```

```
    for j = i:n-1
```

```
        ls(j+1) = (T(i, j+1) - T(i, j)) / (X(j+1)
```

```
- X(j+1-i));
```

```
    end
```

```
    T = [T; ls];
```

```
end
```

```
res = zeros(1, n);
```

```
for i = 2:n
```

```

xp = 1;
for j = 1:i-1
    xp = conv(xp, ps(j, :));
end
xpf = zeros(1, n);
for j = 1:length(xp)
    xpf(n-length(xp)+j) = xp(j);
end
res = res + T(i, i) * xpf;
disp(res)
end

```

```

res(n) = res(n) + T(1, 1);
res = res';
end

```

新牛顿插值：

```
function f =
```

```
new_newton_interpolation_fun(X, Y)
```

```
n=length(X);
```

```
T=zeros(n,n);
```

```
% 对差商表第一列赋值
```

```
for k=1:n
```

```
    T(k)=Y(k);
```

```
end
```

```
% 求差商表
```

```
for i=2:n
```

```
    for k=i:n
```

```
        T(k,i)=(T(k,i-1)-T(k-1,i-1))/(X(k)-X(k+1-i));
```

```
    end
```

```
end
```

```
f = @(x)(T(1,1)+0*x);
```

```
for i = 2:length(X)
```

```
    w = @(x)(1+0*x);
```

```
    for j = 1:i-1
```

```
        w = @(x)(w(x).*(x-X(j)));
```

```
    end
```

```
    f = @(x)(f(x)+T(i, i).*w(x));
```

```
end
```

```
end
```

拉格朗日插值：

```
function res = lagrange_interpolation_fun(X, Y)
```

```
% X:横坐标向量
```

```
% Y:纵坐标向量
```

```
ps = [];
```

```
for i = 1:length(X)
```

```
    ps = [ps; poly(X(i))];
```

```
end
```

```
ls = [];
```

```
for i = 1:length(ps)
```

```
    ll = 1;
```

```
    for j = 1:length(ps)
```

```
        if j == i
```

```
            continue
```

```
        end
```

```
        ll = conv(ll, ps(j, :));
```

```
    end
```

```
    div_ll = 1;
```

```
    for j = 1:length(ps)
```

```
        if j == i
```

```
            continue
```

```
        end
```

```
        div_ll = div_ll * (X(i) - X(j));
```

```
    end
```

```
    ll = ll ./ div_ll;
```

```
    ls = [ls; ll];
```

```
end
```

```
res = 0;
```

```
for i = 1:length(ls)
```

```
    res = res + ls(i, :) * Y(i);
```

```
end
```

```
end
```

Jacobi 迭代：

```
function x = jacobi_fun(a, b, x0, e)
```

```
% a:系数矩阵
```

```
% b:右边向量
```

```
% x0:初始向量(列向量)
```

```
% e:精度
```

```
% 最大迭代次数 M
```

```
n = length(b);
```

```
M = 100000;
```

```
m = 0;
```

```
x = zeros(n, 1);
```

```
% 求系数矩阵的对角矩阵
```

```
cm_diag = diag(diag(a));
```

```
B = cm_diag \ (cm_diag - a);
```

```
% 计算谱半径
```

```

R = max(abs(eig(B)));
if R >= 1
    x = zeros(n, 1);
    disp('谱半径不小于 1, 无法收敛')
    return
end

while m <= M
    m = m + 1;
    for i = 1:n
        sum_ax = 0;
        for j = 1:n
            if j == i
                continue
            end
            sum_ax = sum_ax + a(i, j) *
x0(j);
        end
        x(i) = -(sum_ax - b(i)) / a(i, i);
    end
    if norm(x - x0, 1) < e
        break
    end
    x0 = x;
end
if m > M
    disp('达到最大循环次数')
end
end

G-S 迭代:
function x = gauss_seidel_fun(a, b, x0, e)
% a:系数矩阵
% b:右边向量
% x0:初始向量(列向量)
% e:精度
% 最大迭代次数 M
n = length(b);

% 求系数矩阵的对角矩阵
cm_diag = diag(diag(a));
B = cm_diag \ (cm_diag - a);
% 计算谱半径
R = max(abs(eig(B)));
if R >= 1

```

```

    x = zeros(n, 1);
    disp('谱半径不小于 1, 无法收敛')
    return
end

M = 100000;
m = 0;
x = zeros(n, 1);
while m <= M
    m = m + 1;
    for i = 1:n
        sum_ax = 0;
        for j = 1:i-1
            sum_ax = sum_ax + a(i, j) *
x(j);
        end
        for j = i+1:n
            sum_ax = sum_ax + a(i, j) *
x0(j);
        end
        x(i) = -(sum_ax - b(i)) / a(i, i);
    end
    if norm(x - x0, 1) < e
        break
    end
    x0 = x;
end
if m > M
    disp('达到最大循环次数')
end
end

高斯消去法:
function x = gauss_elimi_fun(a, b)
% a:系数矩阵
% b: 右边向量
% n: 方程组的阶数
% x: 求解结果列向量
n = length(b);
m = zeros(n, n);
x = zeros(n, 1);
for k = 1:n-1
    if det(a) == 0
        disp('第'+str(k)+'次迭代的矩阵 a
的顺序主子式为 0, 无法继续运算');
    end
end

```

```

        return
    end
    for i = k+1:n
        m(i, k) = a(i, k) / a(k, k);
        for j = k+1:n
            a(i, j) = a(i, j) - m(i, k) * a(k, j);
        end
        b(i) = b(i) - m(i, k) * b(k);
    end
end
x(n) = b(n) / a(n, n);
for i = n-1:-1:1
    sum_of_ax = 0;
    for j = i+1:n
        sum_of_ax = sum_of_ax + a(i, j) *
x(j);
    end
    disp(sum_of_ax)
    x(i) = (b(i) - sum_of_ax) / a(i, i);
end
end

```

列主元高斯消去法：

function x = col\_pivot\_gauss\_elimi\_fun(a, b)

% a:系数矩阵

% b: 右边向量

% n: 方程组的阶数

% x: 求解结果列向量

n = length(b);

m = zeros(n, n);

x = zeros(n, 1);

for k = 1:n-1

if det(a) == 0

disp('第'+str(k)+'次迭代的矩阵 a  
的顺序主子式为 0, 无法继续运算');

return

end

max\_ai = k;

max\_a = a(k, k);

for i = k:n

if a(i, k) > max\_a

max\_a = a(i, k);

max\_ai = i;

end

end

if max\_ai ~= k

tmp = a(k, :);

a(k, :) = a(max\_ai, :);

a(max\_ai, :) = tmp;

end

for i = k+1:n

m(i, k) = a(i, k) / a(k, k);

for j = k+1:n

a(i, j) = a(i, j) - m(i, k) \* a(k, j);

end

b(i) = b(i) - m(i, k) \* b(k);

end

end

x(n) = b(n) / a(n, n);

for i = n-1:-1:1

sum\_of\_ax = 0;

for j = i+1:n

sum\_of\_ax = sum\_of\_ax + a(i, j) \*

x(j);

end

x(i) = (b(i) - sum\_of\_ax) / a(i, i);

end

end

三次样条插值：

function res =

cubic\_spline\_interpolation\_fun(X, Y, condi)

% 目前只能设定自然条件

% X:横坐标向量

% Y:纵坐标向量

% condi:边界条件值

n = length(X);

form = zeros(n,n);

form(:,1)=Y;

M0 = condi(1);

Mn = condi(2);

for i=2:n

for j=i:n

form(j,i) =

(form(j,i-1)-form(j-1,i-1))/(X(j)-X(j-i+1));

end

end

h = zeros(n-1,1);

for i=1:n-1

h(i)=X(i+1)-X(i);

```

end
b = zeros(n-2,1);
c = zeros(n-2,n-2);
for i=1:n-2
    c(i,i)=2;
    if (i==1)
        b(i,1)=6
    form(i+2,3)-h(i)/(h(i)+h(i+1))* M0;
    elseif (i==(n-2))
        b(i,1)=6
    form(i+2,3)-(h(i+1)/(h(i)+h(i+1)))* Mn;
    else
        b(i,1)=6 * form(i+2,3);
    end
end
for i=2:n-2
    c(i,i-1)= h(i)/(h(i)+h(i+1));
    c(i-1,i)= h(i)/(h(i-1)+h(i));
end
c(1,n-2) = h(1)/(h(1)+h(2));
c(n-2,1) = h(n-1)/(h(n-2)+h(n-1));
M = c\b;
M = [M0; M; Mn];
res = [];
for i = 1:n-1
    s1 = conv(conv([-1, X(i+1)], [-1, X(i+1)]), [-1, X(i+1)]);
    s1 = s1 * M(i) / (6 * h(i));
    s2 = conv(conv([1, -X(i)], [1, -X(i)]), [1, -X(i)]);
    s2 = s2 * M(i+1) / (6 * h(i));
    s3 = [-1, X(i+1)] * (Y(i) - M(i) * h(i) * h(i) / 6) / h(i);
    s4 = [1, -X(i)] * (Y(i+1) - M(i+1) * h(i) * h(i) / 6) / h(i);
    ss = zeros(1, 4);
    for j = 1:length(s1)
        ss(4-length(s1)+j) =
ss(4-length(s1)+j) + s1(j);
    end
    for j = 1:length(s2)
        ss(4-length(s2)+j) =
ss(4-length(s2)+j) + s2(j);
    end
end

```

```

for j = 1:length(s3)
    ss(4-length(s3)+j) =
ss(4-length(s3)+j) + s3(j);
end
for j = 1:length(s4)
    ss(4-length(s4)+j) =
ss(4-length(s4)+j) + s4(j);
end
res = [res; ss];
end
end
二阶导:
function res = ddif_fun(f, x)
% 求函数数值二阶导
e = 0.0001;
left = diff([f(x-e), f(x)])/e;
right = diff([f(x), f(x+e)])/e;
res = diff([left, right])/e;
end
一阶导:
function res = dif_fun(f, x)
% 求函数数值一阶导
% f:需要求导的函数
% x:求 x 处的导数值
e = 0.00000001;
res = diff([f(x), f(x+e)])/e;
end
展示多项式:
function disp_fun(X)
% X:系数矩阵
% 系数个数 n
n = length(X);
if n == 1
    fprintf('%0.2f', X(1))
elseif n > 1
    res = "";
    for i = 1:n
        if i == 1
            if X(i) == -1
                res = [res, '-'];
            elseif X(i) == 1.0
                res = res;
            else

```

```

        res = [res, num2str(X(i))];
    end
    res = [[res, 'x^'],
num2str(n-i)];
    elseif i < n - 1
        if X(i) > 0
            res = [[[res, '+'],
num2str(X(i))], 'x^'], num2str(n-i)];
        elseif X(i) < 0
            res = [[[res,
num2str(X(i))], 'x^'], num2str(n-i)];
        end
    elseif i == n - 1
        if X(i) > 0
            res = [[[res, '+'],
num2str(X(i))], 'x'];
        elseif X(i) < 0
            res = [[res,
num2str(X(i))], 'x'];
        end
    else
        if X(i) > 0
            res = [[res, '+'],
num2str(X(i))];
        elseif X(i) < 0
            res = [res, num2str(X(i))];
        end
    end
end
end
disp(res)
end

```

句柄函数绘图：

```
function f_plot_fun(f, X, Y, e, x0, y0)
```

% f:函数句柄

% X:插值节点横坐标

% Y:插值节点纵坐标

% left:左边界

% right:右边界

% e:绘制图像中的两点间隔

% x: (可选) 要预测的点横坐标

% y: (可选) 要预测的点纵坐标

```
if nargin > 4
```

```
    left = min([x0 - 2 * e, X(1) - 2 * e]);
```

```
    right = max([x0 + 2 * e, X(length(X)) +
2 * e]);
```

```
else
```

```
    left = X(1) - 2 * e;
```

```
    right = X(length(X)) + 2 * e;
```

```
end
```

```
x = left:e:right;
```

```
y = zeros(1, length(x));
```

```
for i = 1:length(x)
```

```
    y(i) = f(x(i));
```

```
end
```

```
plot(x, y, 'b');
```

```
hold on
```

```
plot(X, Y, 'ro');
```

```
if nargin > 4
```

```
    hold on
```

```
    plot(x0, y0, '*');
```

```
end
```

```
end
```

三次埃尔米特插值：

```
function res = hermite_fun(X,Y,y0,yn)
```

% y0:左边界导数值

% yn:右边界导数值

```
x_input = X;
```

```
y_input = Y;
```

```
n = length(X);
```

```
y_0 = y0;
```

```
y_n = yn;
```

```
[~,number] = size(x_input);
```

```
delta_h = zeros(1,number-1);
```

```
delta_f = zeros(1,number-1);
```

```
lambda_ = zeros(1,number-2);
```

```
miu = zeros(1,number-2);
```

```
e = zeros(1,number-2);
```

```
for i = 1:(number-1)
```

```
    delta_h(i) = x_input(i+1) - x_input(i);
```

```
    delta_f(i) = (y_input(i+1) - y_input(i))/
```

```
delta_h(i);
```

```
end
```

```
for i=1:number-2
```

```
    lambda_(1,i) = delta_h(1,i+1) /
(delta_h(1,i+1) + delta_h(1,i));
```

```
    miu(1,i) = 1 - lambda_(1,i);
```

```
    e(1,i) = 3*(lambda_(1,i)*delta_f(1,i) +
```

```

miu(1,i)*delta_f(1,i+1));
end
A = zeros(number-2,number-2);
B = zeros(number-2,1);
A(1,1) = 2;
A(1,2) = miu(1,1);
B(1,1) = e(1,1) - lambda_(1,1) * y_0;
for i = 2:number-3
    B(i,1) = e(1,i);
    A(i,i-1) = lambda_(1,i);
    A(i,i) = 2;
    A(i,i+1) = miu(1,i);
end
A(number-2,number-3) =
lambda_(1,number-2);
A(number-2,number-2) = 2;
B(number-2,1) = e(1,number-2) -
miu(1,number-2)*y_n;
m_matrix = A\B;
m = zeros(1,number);
m(1) = y_0;
m(number) = y_n;
for i = 2:number-1
    m(i) = m_matrix(i-1,1);
end
res = [];
for i = 1:n-1
    s1 = conv([1/(X(i)-X(i+1)),
-X(i+1)/(X(i)-X(i+1))], [1/(X(i)-X(i+1)),
-X(i+1)/(X(i)-X(i+1))]);
    s1 = conv(s1, [2/(X(i+1)-X(i)),
1-2*X(i)/(X(i+1)-X(i))]);
    s1 = s1 * Y(i);
    s2 = conv([1/(X(i+1)-X(i)),
-X(i)/(X(i+1)-X(i))], [1/(X(i+1)-X(i)),
-X(i)/(X(i+1)-X(i))]);
    s2 = conv(s2, [2/(X(i)-X(i+1)),
1-2*X(i+1)/(X(i)-X(i+1))]);
    s2 = Y(i+1) * s2;
    s3 = conv([1/(X(i)-X(i+1)),
-X(i+1)/(X(i)-X(i+1))], [1/(X(i)-X(i+1)),
-X(i+1)/(X(i)-X(i+1))]);
    s3 = m(i) * conv(s3, [1, -X(i)]);
    s4 = conv([1/(X(i+1)-X(i)),

```

```

-X(i)/(X(i+1)-X(i))], [1/(X(i+1)-X(i)),
-X(i)/(X(i+1)-X(i))]);
    s4 = m(i+1) * conv(s4, [1, -X(i+1)]);
    res = [res; s1+s2+s3+s4];
end
end
分段插值函数绘图：
function multi_poly_plot_fun(param, X, Y, e,
x0, y0)
% param:多项式系数向量
% X:插值节点横坐标
% Y:插值节点纵坐标
% left:左边界
% right:右边界
% e:绘制图像中的两点间隔
% x: (可选) 要预测的点横坐标
% y: (可选) 要预测的点纵坐标
[n, m] = size(param);
for i = 1:n
    if i == 1
        if nargin > 4
            left = min([x0 - 3 * e, X(i) - 3 *
e]);
            x = left:e:X(i+1);
        else
            x = (X(i)-3 * e):e:X(i+1);
        end
    elseif i == n
        if nargin > 4
            right = max([x0 + 3 * e, X(i+1)
+ 3 * e]);
            x = X(i):e:right;
        else
            x = X(i):e:X(i+1) + 3 * e;
        end
    else
        x = X(i):e:X(i+1);
    end
    y = zeros(1, length(x));
    for j = 1:m
        y = y + param(i, j) * x .^ (m-j);
    end
    plot(x, y, 'b');
    hold on

```

```

end
plot(X, Y, 'ro');
if nargin > 6
    hold on
    plot(x0, y0, '*');
end
end
牛顿前向插值
function [res, param] =
newton_forward_interpolation_fun(X, Y, x)
% X:横坐标向量
% Y:纵坐标向量
% x:插值节点
n = length(X);
inter = X(2) - X(1);
dt = Y;
for i = 2:n
    dl = zeros(1, n);
    for j = i:n
        dl(j) = dt(i-1, j) - dt(i-1, j-1);
    end
    dt = [dt; dl];
end
t = (x - X(1)) / inter;
param = zeros(1, n);
pse = zeros(1, n);
pse(n) = dt(1, 1);
param = param + pse;
ps = 1;
for i = 2:n
    ps = conv(ps, [1, 2-i]);
    for j = 1:length(ps)
        pse(n-length(ps)+j) = ps(j);
    end
    pse = pse * dt(i, i);
    pse = pse ./ factorial(i-1);
    param = param + pse;
end
res = 0;
for i = 1:n
    res = res + param(i) * t^(n-i);
end
end
已知重根数的牛顿迭代法:

```

```

function res = newton_know_root_fun(f, x0,
m, e)
% f:函数
% x0:初始迭代值
% m:m 重根
% e:精度
x1 = x0 - f(x0) / dif_fun(f, x0);
while abs(x1 - x0) >= e
    x0 = x1;
    x1 = x0 - m * f(x0) / dif_fun(f, x0);
end
res = x1;
end
未知重根数的牛顿迭代法:
function res = newton_unknow_root_fun(f,
x0, e)
% f:函数
% x0:初始迭代值
% e:精度
x1 = x0 - f(x0) / dif_fun(f, x0);
while abs(x1 - x0) >= e
    x0 = x1;
    x1 = x0 - dif_fun(f, x0) * f(x0) / (dif_fun(f,
x0) * dif_fun(f, x0) - f(x0) * ddif_fun(f, x0));
end
res = x1;
end
线性插值:
function res =
piecewise_linear_interpolation_fun(X, Y)
% X:横坐标向量
% Y:纵坐标向量
n = length(X);
res = zeros(n-1, 2);
for i = 1:n-1
    res(i, 1) = Y(i) / (X(i) - X(i+1)) + Y(i+1) /
(X(i+1) - X(i));
    res(i, 2) = -X(i+1) * Y(i) / (X(i) - X(i+1)) -
X(i) * Y(i+1) / (X(i+1) - X(i));
end
多项式求值:
function y = poly_value_fun(param, x)
y = 0;
for j = 1:length(param)

```



```

        y = y + param(j) * x ^
(length(param)-j);
end

end
SOR 迭代法:
function x = sor_fun(a, b, n, x0, e, w)
% a:系数矩阵
% b:右边向量
% x0:初始向量(列向量)
% e:精度
% w:松弛因子
% 最大迭代次数 M
M = 100000;
m = 0;
x = zeros(n, 1);
while m <= M
    m = m + 1;
    for i = 1:n
        sum_ax = 0;
        for j = 1:i-1
            sum_ax = sum_ax + a(i, j) *
x(j);
        end
        for j = i+1:n
            sum_ax = sum_ax + a(i, j) *
x0(j);
        end
        if i == 0
            x(i) = -(sum_ax - b(i)) / a(i, i);
        elseif i > 0
            x(i) = -w * (sum_ax - b(i)) /
a(i, i) + (1 - w) * x0(i);
        end
        end
        if norm(x - x0, 1) < e
            break
        end
        x0 = x;
    end
    if m > M
        disp('达到最大循环次数')
    end
end
end

```

## 牛顿法

牛顿迭代公式:

$$x_{k+1} = x_k - \frac{f(x_k)}{f'(x_k)}$$

算法:

- Step 0: 给定初始估计  $x_0$ , 以及预设精度  $\varepsilon$
- Step 1: 计算  $x_1 = x_0 - f(x_0)/f'(x_0)$
- Step 2: 若  $|x_1 - x_0| < \varepsilon$ , 则停止, 输出近似解  $x_1$ ; 否则, 令  $x_0 = x_1$ , 返回Step 1。

## 解决初值问题—牛顿下山法

- 如何保证单调性呢?
- 将牛顿迭代公式改为

$$x_{k+1} = x_k - \lambda \frac{f(x_k)}{f'(x_k)}$$

- 其中,  $\lambda$  是下山因子。
- 选择合适的下山因子以保证单调性。
- 可以采取逐步搜索的方式, 从  $\lambda = 1$  开始, 逐次取前一次的一半, 直到单调性满足。

## 解决重根问题

- 当  $m$  已知时, 由于  $x^*$  是方程  $f(x)^{1/m} = 0$  的单根, 对此方程应用牛顿迭代公式, 有

$$x_{k+1} = x_k - m \frac{f(x_k)}{f'(x_k)}, k = 0, 1, 2, \dots$$

- 当  $m$  未知时, 令  $u(x) = f(x)/f'(x)$ , 则  $x^*$  是方程  $u(x) = 0$  的单根。对  $u(x)$  用牛顿法进行求解, 其迭代公式如下

$$x_{k+1} = x_k - m \frac{f'(x_k)f(x_k)}{f'(x_k)^2 - f(x_k)f''(x_k)}, k = 0, 1, 2, \dots$$

## Gauss 消去法的算法

Step 0: 输入方程组的阶数  $n$ , 系数矩阵  $A$  和右边向量  $b$

Step 1: 对  $k = 1, 2, \dots, n-1$ ,  $i, j = k+1, k+2, \dots, n$ , 假设  $a_{kk} \neq 0$ , 计算

$$\begin{cases} m_{ik} = a_{ik}/a_{kk} \\ a_{ij} = a_{ij} - m_{ik}a_{kj} \\ b_i = b_i - m_{ik}b_k \end{cases}$$

Step 2: 对  $i = n-1, n-2, \dots, 1$ , 计算

$$\begin{cases} x_n = b_n/a_{nn} \\ x_i = \frac{b_i - \sum_{j=i+1}^n a_{ij}x_j}{a_{ii}} \end{cases}$$

### 列主元 Gauss 消去法的算法

Step 0: 输入方程组的阶数  $n$ , 系数矩阵  $A$  和右边向量  $b$

Step 1: 对  $k = 1, 2, \dots, n-1$ ,

计算  $|a_{kk}| = \max_{k \leq i \leq n} \{|a_{ik}|\}$ ;

如果  $|a_{kk}| = 0$ , 则停止; 否则,

若  $i_k \neq k$ , 则交换  $A$  和  $b$  的第  $i_k$  行与第  $k$  行;

### 列主元 Gauss 消去法的算法

Step 1: 对  $i, j = k+1, k+2, \dots, n$ , 计算

$$\begin{cases} m_{ik} = a_{ik}/a_{kk} \\ a_{ij} = a_{ij} - m_{ik}a_{kj} \\ b_i = b_i - m_{ik}b_k \end{cases}$$

Step 2: 对  $i = n-1, n-2, \dots, 1$ , 计算

$$\begin{cases} x_n = b_n/a_{nn} \\ x_i = \frac{b_i - \sum_{j=i+1}^n a_{ij}x_j}{a_{ii}} \end{cases}$$

### Jacobi 迭代的算法

Step 0: 输入方程组的阶数  $n$ , 系数矩阵  $A$  和右边向量  $b$ , 初始向量  $x_0$ , 误差要求  $\epsilon$ , 最大迭代次数  $M$ ,  $m = 0$

Step 1: 对  $i = 1, 2, \dots, n$ , 计算

$$x_i = -\frac{1}{a_{ii}} \left( \sum_{j=1, j \neq i}^n a_{ij}x_{0j} - b_i \right), m = m + 1 \quad (4)$$

Step 2: 若  $\|x - x_0\| < \epsilon$ , 则计算停止, 输出  $x$ ; 否则若  $m > M$ , 则终止, 输出“达到最大循环次数”; 否则令  $x_0 = x$ , 返回到 Step 1。

■ 把系数矩阵  $A$  写成

$$A = D + L + U \quad (5)$$

的形式。其中,  $D$  是由  $A$  的对角线元素组成的对角矩阵,  $L$  和  $U$  分别为的严格下三角和严格上三角部分构成的严格三角形矩阵。

■ 从而, 公式 (7) 的矩阵形式为

$$x^{(k+1)} = -D^{-1}(L + U)x^{(k)} + D^{-1}b, k = 0, 1, 2, \dots \quad (6)$$

■ Jacobi 迭代矩阵为

$$B = -D^{-1}(L + U) \quad (7)$$

### Gauss-Seidel 迭代的算法

Step 0: 输入方程组的阶数  $n$ , 系数矩阵  $A$  和右边向量  $b$ , 初始向量  $x_0$ , 误差要求  $\epsilon$ , 最大迭代次数  $M$ ,  $m = 0$

Step 1: 对  $i = 1, 2, \dots, n$ , 计算

$$x_i = -\frac{1}{a_{ii}} \left( \sum_{j=1}^{i-1} a_{ij}x_j + \sum_{j=i+1}^n a_{ij}x_{0j} - b_i \right), m = m + 1 \quad (8)$$

Step 2: 若  $\|x - x_0\| < \epsilon$ , 则计算停止, 输出  $x$ ; 否则若  $m > M$ , 则终止, 输出“达到最大循环次数”; 否则令  $x_0 = x$ , 返回到 Step 1。

■ Gauss-Seidel 迭代格式的矩阵形式为

$$x^{(k+1)} = -(D + L)^{-1}Ux^{(k)} + (D + L)^{-1}b, k = 0, 1, 2, \dots \quad (9)$$

■ 迭代矩阵  $B$  为

$$B = -(D + L)^{-1}U \quad (10)$$

拉格朗日插值:

■  $l_0(x), l_1(x), \dots, l_n(x)$  构成不超过  $n$  次多项式集合的一组基。

■  $l_0(x), l_1(x), \dots, l_n(x)$  只与插值节点有关, 和  $f(x)$  的值无关。

■ 引入函数  $w_{n+1}(x) = (x - x_0)(x - x_1) \cdots (x - x_n)$ , 则拉格朗日插值基函数可以表示为

$$l_k(x) = \frac{w_{n+1}(x)}{(x - x_k)w'_{n+1}(x_k)}, k = 0, 1, \dots, n \quad (5)$$

■ 已知函数  $y = f(x)$  在  $x_0 = -2, x_1 = -1, x_2 = 0, x_3 = 1$  处的值分别为  $y_0 = 3, y_1 = 1, y_2 = 1, y_3 = 6$ , 据此构造拉格朗日插值多项式并求  $f(0.5)$  的近似值。

解: 有之前的定义可以构造

$$\begin{aligned} L_3(x) &= y_0l_0(x) + y_1l_1(x) + y_2l_2(x) + y_3l_3(x) \\ &= 3 * \frac{(x+1)(x-0)(x-1)}{(-2+1)(-2-0)(-2-1)} + 1 * \frac{(x+2)(x-0)(x-1)}{(-1+2)(-1-0)(-1-1)} \\ &\quad + 1 * \frac{(x+2)(x+1)(x-1)}{(0+2)(0+1)(0-1)} + 6 * \frac{(x+2)(x+1)(x-0)}{(1+2)(1+1)(1-0)} \\ &= 0.5x^3 + 2.5x^2 + 2x + 1 \end{aligned}$$

给定函数  $f(x)$  在  $(a, b)$  上  $n+1$  个互异节点  $x_0, x_1, \dots, x_n$  处的函数值  $f(x_i), i = 0, 1, 2, \dots, n$ , 称

$$f(x_i, x_j) = \frac{f(x_i) - f(x_j)}{x_i - x_j} \quad (10)$$

为  $f(x)$  关于点  $x_i$  及  $x_j$  的一阶差商;

$$f(x_i, x_j, x_k) = \frac{f(x_i, x_j) - f(x_j, x_k)}{x_i - x_k} \quad (11)$$

为  $f(x)$  关于点  $x_i, x_j$  及  $x_k$  的二阶差商。

- 记公式 (13) 为

$$f(x) = N_n(x) + R_n(x) \quad (14)$$

其中,

$$N_n(x) = f(x_0) + f(x_0, x_1)(x - x_0) + f(x_0, x_1, x_2)(x - x_0)(x - x_1) + \dots + f(x_0, x_1, \dots, x_n)(x - x_0)(x - x_1) \dots (x - x_{n-1}) \quad (15)$$

$$R_n(x) = f(x, x_0, x_1, \dots, x_n)(x - x_0)(x - x_1) \dots (x - x_n) \quad (16)$$

牛顿前插:

- 已知在等距节点  $x_k = x_0 + kh$ ,  $k = 0, 1, \dots, n$  处的函数值  $f_k = f(x_k)$
- 对于点  $x$ , 可令  $x = x_0 + th$ , 牛顿前插公式为

$$N_n(x) = f_0 + t \Delta f_0 + \frac{t(t-1)}{2!} \Delta^2 f_0 + \dots + \frac{t(t-1) \dots (t-n+1)}{n!} \Delta^n f_0 \quad (3)$$

- 插值余项为

$$R_n(x) = \frac{t(t-1) \dots (t-n)}{(n+1)!} h^{n+1} f^{(n+1)}(\xi), \xi \in (x_0, x_n) \quad (4)$$

- 给出  $f(x) = \cos x$  在等距节点  $0:0.1:0.5$  处的函数值, 试用 4 次 Newton 前插公式计算  $f(0.048)$  的近似值, 并估计误差。

- 去等距节点  $0, 0.1, 0.2, 0.3, 0.4$ , 做查分表

$x_k$	$f(x_k)$	$\Delta f$	$\Delta^2 f$	$\Delta^3 f$	$\Delta^4 f$
0.0	1.00000				
0.1	0.99500	-0.00500			
0.2	0.98007	-0.01493	-0.00993		
0.3	0.95534	-0.02473	-0.00980	-0.00013	
0.4	0.92106	-0.03428	-0.00955	-0.00025	-0.00012

- 通过插值点  $x = 0.048$ , 计算出  $t = (x - x_0)/0.1 = 0.48$ 。
- 代入公式 (3), 可以计算得到结果, 约等于 0.99884。

分段线性插值:

- 容易求得, 在每个区间  $(x_i, x_{i+1})$  上,

$$l_h(x) = \frac{x - x_{i+1}}{x_i - x_{i+1}} y_i + \frac{x - x_i}{x_{i+1} - x_i} y_{i+1} \quad (5)$$

- 令  $M_2 = \max_{a \leq x \leq b} |f''(x)|$ ,  $h = \max_{0 \leq i \leq n-1} (x_{i+1} - x_i)$ , 则对于任意的  $x \in (a, b)$ , 插值余项满足

$$|R(x)| = |f(x) - l_h(x)| \leq \frac{M_2}{8} h^2 \quad (6)$$

埃尔米特插值:

- 利用构造法, 可以得到基函数  $\alpha_k(x)$ 、 $\alpha_{k+1}(x)$ 、 $\beta_k(x)$  和  $\beta_{k+1}(x)$  的具体形式。
- 最终,  $H_3(x)$  在  $(x_k, x_{k+1})$  的表达式为

$$H_3(x) = y_k(1 + 2\frac{x - x_k}{x_{k+1} - x_k})(\frac{x - x_{k+1}}{x_k - x_{k+1}})^2 + y_{k+1}(1 + 2\frac{x - x_{k+1}}{x_k - x_{k+1}})(\frac{x - x_k}{x_{k+1} - x_k})^2 + m_k(x - x_k)(\frac{x - x_{k+1}}{x_k - x_{k+1}})^2 + m_{k+1}(x - x_{k+1})(\frac{x - x_k}{x_{k+1} - x_k})^2 \quad (10)$$

三次样条插值:

- 利用插值条件  $S(x_i) = y_i$ ,  $S(x_{i+1}) = y_{i+1}$ , 得到

$$S_i(x) = \frac{(x_{i+1} - x)^3}{6h_i} M_i + \frac{(x - x_i)^3}{6h_i} M_{i+1} + (y_i - \frac{M_i h_i^2}{6}) \frac{x_{i+1} - x}{h_i} + (y_{i+1} - \frac{M_{i+1} h_i^2}{6}) \frac{x - x_i}{h_i} \quad (4)$$

- 针对第二类边界条件:  $S''(x_0) = M_0$ ,  $S''(x_n) = M_n$ , 等于只有  $n-1$  个未知数, 则直接用三弯矩方程

$$\begin{bmatrix} 2 & \lambda_1 & & & \\ \mu_2 & 2 & \lambda_2 & & \\ & \dots & \dots & \dots & \\ & & \mu_{n-2} & 2 & \lambda_{n-2} \\ & & & \mu_{n-1} & 2 \end{bmatrix} \begin{bmatrix} M_1 \\ M_2 \\ \dots \\ M_{n-2} \\ M_{n-1} \end{bmatrix} = \begin{bmatrix} d_1 - \mu_1 M_0 \\ d_2 \\ \dots \\ d_{n-2} \\ d_{n-1} - \lambda_{n-1} M_n \end{bmatrix} \quad (8)$$

过去题目代码:

```
function res = division(fun, precision, b, e)
    res = 0;
    max_iter = 2000;
    iter = 1;
    while(abs(res - (b + e) / 2) >= precision && iter <= max_iter)
        res = (b + e) / 2;
        if fun(b) * fun(res) <= 0
            e = res;
        else
            b = res;
        end
        iter = iter + 1;
    end
    res = (b + e) / 2;
end

function res = fixed_point(fun, precision, begin)
    res = eval(fun(begin));
    max_iter = 2000;
    iter = 1;
    while(abs(res - eval(fun(res))) >= precision && iter <= max_iter)
        res = eval(fun(res));
        iter = iter + 1;
    end
    res = eval(fun(res));
end

function res = newton(fun, precision, begin)
    syms x;
    diff_fun(x) = diff(fun(x));
    res = begin;
    iter = 1;
    max_iter = 2000;
    while(abs(res - (res - eval(fun(res)) ./ eval(diff_fun(res)))) >= ...
        precision && iter <= max_iter)
        res = res - eval(fun(res)) ./ eval(diff_fun(res));
        iter = iter + 1;
    end
    res = res - eval(fun(res)) ./ eval(diff_fun(res));
end
```

%% 用二分法、不动点迭代 (与牛顿法不一样)、牛顿法求解以下非线性方程。

% (1)  $\sin x = 6x + 5$

% (2)  $\ln x + x^2 = 3$

```

% (3)  $e^x + x = 7$ 
clear;clc;
% 终止条件为前后两次近似解之差小于
 $10^{-3}$ 
precision = 0.001;
% 声明自变量 x
syms x;
%%  $\sin x = 6x + 5$ 
disp('方程一:  $\sin x = 6x + 5$ ');

% 二分法
fun(x) = sin(x) - 6*x - 5;
division_res = division(fun, precision, -1, 0);
disp('二分法: ');
disp('观察可知该方程在-1 和 0 间有解');
disp('求解结果: ');
disp(division_res);

% 不动点法
fun(x) = (sin(x) - 5) / 6;
fixed_point_res = fixed_point(fun, precision, -1);
disp('不动点迭代法: ');
disp('将方程变形为  $x = (\sin(x) - 5) / 6$ , 取  $x = -1$  作为初始迭代解');
disp('求解结果: ');
disp(fixed_point_res);

% 牛顿法
fun(x) = sin(x) - 6*x - 5;
newton_res = newton(fun, precision, -1);
disp('牛顿法: ');
disp('取  $x = -1$  作为初始迭代解');
disp('求解结果: ');
disp(newton_res);

%%  $\ln x + x^2 = 3$ 
disp('方程二:  $\ln x + x^2 = 3$ ');

% 二分法
fun(x) = log(x) + x^2 - 3;
division_res = division(fun, precision, 1, 2);
disp('二分法: ');
disp('观察可知该方程在 1 和 2 间有解');

```

```

disp('求解结果: ');
disp(division_res);

% 不动点法
fun(x) = sqrt(3 - log(x));
fixed_point_res = fixed_point(fun, precision, 2);
disp('不动点迭代法: ');
disp('将方程变形为  $x = (3 - \ln(x))^{0.5}$ , 取  $x = 2$  作为初始迭代解');
disp('求解结果: ');
disp(fixed_point_res);

% 牛顿法
fun(x) = log(x) + x^2 - 3;
newton_res = newton(fun, precision, 2);
disp('牛顿法: ');
disp('取  $x = 2$  作为初始迭代解');
disp('求解结果: ');
disp(newton_res);

%%  $e^x + x = 7$ 
disp('方程三:  $e^x + x = 7$ ');

% 二分法
fun(x) = exp(x) + x - 7;
division_res = division(fun, precision, 1, 2);
disp('二分法: ');
disp('观察可知该方程在 1 和 2 间有解');
disp('求解结果: ');
disp(division_res);

% 不动点法
fun(x) = log(7 - x);
fixed_point_res = fixed_point(fun, precision, 2);
disp('不动点迭代法: ');
disp('将方程变形为  $x = \ln(7 - x)$ , 取  $x = 2$  作为初始迭代解');
disp('求解结果: ');
disp(fixed_point_res);

% 牛顿法
fun(x) = exp(x) + x - 7;

```

```

newton_res = newton(fun, precision, 2);
disp('牛顿法: ');
disp('取 x = 2 作为初始迭代解');
disp('求解结果: ');
disp(newton_res);

function res = gauss_elimination(cm, bm)
% input:
% cm: 系数矩阵:n*n
% bm: 常数项矩阵:n*1
% output:
% res: 求解结果:n*1

[rcm, ccm] = size(cm);
[rbm, ~] = size(bm);
res = zeros(rbm, 1);
if (rcm ~= ccm) || (rcm ~= rbm)
    disp('输入矩阵格式错误');
else
    for i = 1:rcm-1
        if cm(i, i) == 0
            disp('主对角线元素错误');
        else
            for j = i+1:rcm
                ratio = cm(j, i) / cm(i, i);
                for k = i+1:ccm
                    cm(j, k) = cm(j, k) - ratio * cm(i, k);
                end
                bm(j) = bm(j) - ratio * bm(i);
                cm(j, 1) = 0;
            end
        end
    end
    end
    res(rcm) = bm(rcm) / cm(rcm, ccm);
    for i = rcm-1:-1:1
        tmp = 0;
        for j = i+1:ccm
            tmp = tmp + cm(i, j) * res(j);
        end
        res(i) = (bm(i) - tmp) / cm(i, i);
    end
end

function [convergence, res] = GS(cm, bm, precision)
    iter = 1;
    convergence = true;
    max_iter = 10000;
    [rbm, ~] = size(bm);
    % 求系数矩阵的对角矩阵
    cm_diag = diag(diag(cm));
    % 求系数矩阵的下三角矩阵
    low_diag = -tril(cm, -1);
    % 求系数矩阵的上三角矩阵
    up_diag = -triu(cm, 1);

    B = (cm_diag - low_diag) \ up_diag;
    % 计算谱半径
    R = max(abs(eig(B)));
    if R >= 1
        convergence = false;
        res = zeros(rbm, 1);
        return
    end
    f = (cm_diag - low_diag) \ bm;
    res = zeros(rbm, 1);
    while (norm(res - (B * res + f)) >= precision && iter <= max_iter)
        res = B * res + f;
        iter = iter + 1;
    end
end

```

```

function [convergence, res] = jacobi(cm, bm, precision)
    iter = 1;
    convergence = true;
    max_iter = 2000;
    [rbm, ~] = size(bm);
    % 求系数矩阵的对角矩阵
    cm_diag = diag(diag(cm));

    B = cm_diag \ (cm - cm_diag);
    % 计算谱半径
    R = max(abs(eig(B)));
    if R >= 1
        convergence = false;
        res = zeros(rbm, 1);
        return
    end
    f = cm_diag \ bm;
    res = zeros(rbm, 1);
    while (norm(res - (B * res + f)) >= precision && iter <= max_iter)
        res = B * res + f;
        iter = iter + 1;
    end
end

```

%% 用高斯消去法、Jacobi 迭代、G-S 迭代  
求解以下线性方程组。

clear;clc;

precision = 0.001;

%% 第一问

%  $2x - 2y - z = ?2$

%  $4x + y - 2z = 1$

%  $-2x + y - z = ?3$

disp('第一问: ');

% 系数矩阵 cm

cm = [2, -2, -1; 4, 1, -2; -2, 1, -1];

% 常数项矩阵

bm = [-2; 1; -3];

% 高斯消去法

gauss\_res = gauss\_elimination(cm, bm);

disp('高斯消去法结果: ');

disp(gauss\_res);

% Jacobi 迭代

[convergence, jacobi\_res] = jacobi(cm, bm,  
precision);

disp('Jacobi 迭代结果: ');

if convergence

disp(jacobi\_res);

else

disp('谱半径不小于 1, 迭代不收敛');

end

% G-S 迭代



```

[convergence, GS_res] = GS(cm, bm, precision);
disp('G-S 迭代结果: ');
if convergence
    disp(GS_res);
else
    disp('谱半径不小于 1, 迭代不收敛');
end

%% 第二问

```

```

disp('第二问: ');

```

```

% 系数矩阵 cm
cm = zeros(100, 100);
for i = 1:100
    cm(i, i) = 3;
    if i < 100
        cm(i+1, i) = -1;
        cm(i, i+1) = -1;
    end
end

```

```

% 常数项矩阵
bm = ones(100, 1);
bm(1) = 2;
bm(100) = 2;

```

```

% 高斯消去法
gauss_res = gauss_elimination(cm, bm);
disp('高斯消去法结果: ');
disp(gauss_res);

% Jacobi 迭代
[convergence, jacobi_res] = jacobi(cm, bm, precision);
disp('Jacobi 迭代结果: ');
if convergence
    disp(jacobi_res);
else
    disp('谱半径不小于 1, 迭代不收敛');
end

% G-S 迭代
[convergence, GS_res] = GS(cm, bm, precision);
disp('G-S 迭代结果: ');
if convergence

```