Review

- 多元Taylor公式

带Lagrange余项的一阶Taylor公式

$$f(\mathrm{x}_0+\Delta\mathrm{x}) = f(\mathrm{x}_0) + \mathrm{J}f(\mathrm{x}_0)\Delta\mathrm{x} + \frac{1}{2}(\Delta\mathrm{x})^{\mathrm{T}} H(\mathrm{x}_0+\theta\Delta\mathrm{x})\Delta\mathrm{x}$$

带Peano余项的二阶Taylor公式

$$f(\mathrm{x}_0+\Delta\mathrm{x}) = f(\mathrm{x}_0) + \mathrm{J}f(\mathrm{x}_0)\Delta x + \frac{1}{2}(\Delta\mathrm{x})^{\mathrm{T}} H(\mathrm{x}_0)\Delta\mathrm{x} + o(\|\Delta\mathrm{x}\|^2),\ \Delta\mathrm{x}\to 0\text{时}$$

带*Lagrange*余项的*n*阶*Taylor*公式

$$f(x,y)=f(x_0,y_0)+\left(h\frac{\partial}{\partial x}+k\frac{\partial}{\partial y}\right)f(x_0,y_0)$$

$$+\cdots+\frac{1}{n!}\left(h\frac{\partial}{\partial x}+k\frac{\partial}{\partial y}\right)^n f(x_0,y_0)$$

$$+\frac{1}{(n+1)!}\left(h\frac{\partial}{\partial x}+k\frac{\partial}{\partial y}\right)^{n+1} f(x_0+\theta h,y_0+\theta k)$$

$$(0<\theta<1)$$

带 $Peano$ 余项的 n 阶 $Taylor$ 公式

$$f(x,y)=f(x_0,y_0)+\left(h\frac{\partial}{\partial x}+k\frac{\partial}{\partial y}\right)f(x_0,y_0)$$

$$+\cdots+\frac{1}{n!}\left(h\frac{\partial}{\partial x}+k\frac{\partial}{\partial y}\right)^n f(x_0,y_0)$$

$$+o\left(\left(\sqrt{h^2+k^2}\right)^n\right).$$

- 利用Taylor公式的唯一性求函数的Taylor公式

§9. 多元函数的(无条件)极值

首先回顾一元函数的极值问题.设f充分光滑.

$$f(x_0)\text{极小}\Rightarrow f'(x_0)=0,\ f(x_0)\text{极大}\Rightarrow f'(x_0)=0,$$

$$\left.\begin{array}{l} f'(x_0)=0 \\ f''(x_0)>0 \end{array}\right\}\Rightarrow f(x_0)\text{严格极小},$$

$$\left.\begin{array}{l} f'(x_0)=0 \\ f''(x_0)<0 \end{array}\right\}\Rightarrow f(x_0)\text{严格极大}.$$

$$f(x_0)\text{极小}\Rightarrow f''(x_0)\geq 0,\ f(x_0)\text{极大}\Rightarrow f''(x_0)\leq 0.$$

研究极值问题的根本方法是Taylor展开. 例如

$$\left.\begin{array}{l} f'(x_0)=f''(x_0)=f'''(x_0)=0 \\ f^{(4)}(x_0)>0 \end{array}\right\} \Rightarrow f(x_0)\text{极小},$$

$$\left.\begin{array}{l} f'(x_0)=f''(x_0)=f'''(x_0)=0 \\ f^{(4)}(x_0)<0 \end{array}\right\} \Rightarrow f(x_0)\text{极大},$$

$$\left.\begin{array}{l} f'(x_0)=f''(x_0)=0 \\ f'''(x_0)\neq 0 \end{array}\right\} \Rightarrow f(x_0)\text{不是极值}.$$

1.极值的定义与必要性

Def. n元函数f在$x_0\left(\in\mathbb{R}^n\right)$的某个邻域$U$中有定义,

若$\forall x\in U, x\neq x_0$,都有

$$f(x)(>)\geq f(x_0),$$

则称$f(x_0)$为f的一个(严格)极小值,称x_0为f的一个(严格)极小值点.若$\forall x\in U, x\neq x_0$,都有

$$f(x)(<)\leq f(x_0),$$

则称$f(x_0)$为f的一个(严格)极大值,称x_0为f的一个(严格)极大值点.

Thm. n元函数f在$x_0=\left(x_1^0,x_2^0,\cdots,x_n^0\right)\in\mathbb{R}^n$可微，$f(x_0)$极小(大)，则$x_0$为$f$的一个**驻点**，即

$$\operatorname{grad}f(x_0)=0.$$

Proof. $f(x_0)$极小，一元函数$f\left(x_1,x_2^0,\cdots,x_n^0\right)$在$x_1^0$取到极小值，从而$\dfrac{\partial f}{\partial x_1}(x_0)=0$. 同理，$\dfrac{\partial f}{\partial x_k}(x_0)=0, k=2,3,\cdots n$. 于是$\operatorname{grad}f(x_0)=0$. □

Remark: 对一般的函数f, $f(x_0)$极小, x_0不一定为驻点. 例如$f(x,y)=\sqrt{x^2+y^2}$, $f(0,0)$极小,但$(0,0)$不是f的驻点(偏导数不存在).

Remark: $\mathrm{grad} f(x_0)=0$, 但x_0不一定是f的极值点.例如, $f(x,y)=x^2-y^2$, $\mathrm{grad} f(0,0)=0$, 但$(0,0)$不是f的极值点.

Remark: 定义域内部的极大(小)值不一定是最大(小)值;反之,若最大(小)值在定义域内部取到, 则一定是极大(小)值.

2. 矩阵的正定性

$$P=(a_{ij})_{n\times n}\in M_{n\times n},(P^T=P),$$

$$\mathrm{x}=\left(x_1,x_2,\cdots,x_n\right)^T\in\mathbb{R}^n.$$

$$\text{二次型}:\mathrm{x}^T P\mathrm{x}=\sum_{i,j=1}^{n}a_{ij}x_ix_j$$

Def. 设 $P\in M_{n\times n}, P^T=P$,

称 P 正定(负定), 若 $\forall \mathrm{x}\in\mathbb{R}^n, \mathrm{x}\neq 0, \mathrm{x}^T P\mathrm{x}>(<)0$.

称 P 半正定(半负定), 若 $\forall \mathrm{x}\in\mathbb{R}^n, \mathrm{x}\neq 0, \mathrm{x}^T P\mathrm{x}\geq(\leq)0$.

称 P 不定, 若 $\exists \mathrm{x},\mathrm{y}\in\mathbb{R}^n, \mathrm{x}^T P\mathrm{x}>0, \mathrm{y}^T P\mathrm{y}<0$.

Thm. $P \in M_{n\times n}, P^T = P$,则

P正定 $\Leftrightarrow P$的每个主子式>0

$\Leftrightarrow P$的每个顺序主子式>0

$\Leftrightarrow P$的所有特征值都>0

P半正定 $\Leftrightarrow P$的每个主子式≥ 0

$\Leftrightarrow P$的所有特征值都≥ 0.

3.极值的充分条件

Lemma1.设n阶实对称阵A的所有特征值为$\lambda_1 \le \lambda_2 \le \cdots \le \lambda_n$,则 $\lambda_1 \|\mathrm{x}\|^2 \le \mathrm{x}^{\mathrm{T}}\mathrm{A}\mathrm{x} \le \lambda_n \|\mathrm{x}\|^2, \ \forall \mathrm{x} \in \mathbb{R}^n$.

Proof.A实对称阵, 则存在正交矩阵Q,$s.t.$

$$\mathrm{Q}^{\mathrm{T}}\mathrm{A}\mathrm{Q} = \Lambda = diag(\lambda_1, \lambda_2, \cdots, \lambda_n).$$

令$\mathrm{x} = \mathrm{Q}\mathrm{y}$,则

$$\|\mathrm{x}\|^2 = \mathrm{x}^{\mathrm{T}}\mathrm{x} = \mathrm{y}^{\mathrm{T}}\mathrm{Q}^{\mathrm{T}}\mathrm{Q}\mathrm{y} = \mathrm{y}^{\mathrm{T}}\mathrm{y} = \|\mathrm{y}\|^2,$$

$$\mathrm{x}^{\mathrm{T}}\mathrm{A}\mathrm{x} = \mathrm{y}^{\mathrm{T}}\mathrm{Q}^{\mathrm{T}}\mathrm{A}\mathrm{Q}\mathrm{y} = \mathrm{y}^{\mathrm{T}}\Lambda\mathrm{y} = \lambda_1 \mathrm{y}_1^2 + \cdots + \lambda_n \mathrm{y}_n^2,$$

$$\lambda_1 \|\mathrm{y}\|^2 \le \mathrm{x}^{\mathrm{T}}\mathrm{A}\mathrm{x} \le \lambda_n \|\mathrm{y}\|^2,$$

故$\lambda_1 \|\mathrm{x}\|^2 \le \mathrm{x}^{\mathrm{T}}\mathrm{A}\mathrm{x} \le \lambda_n \|\mathrm{x}\|^2, \ \forall \mathrm{x} \in \mathbb{R}^n$.□

Thm. n元函数f在x_0的邻域中二阶连续可微,

$\mathrm{grad}f(\mathrm{x}_0)=0$,

(1)若$H_f(\mathrm{x}_0)$正定,则$f(\mathrm{x}_0)$严格极小.

(2)若$H_f(\mathrm{x}_0)$负定,则$f(\mathrm{x}_0)$严格极大.

(3)若$H_f(\mathrm{x}_0)$不定,则$f(\mathrm{x}_0)$不是极值.

Proof:记$\Delta\mathrm{x}=\mathrm{x}-\mathrm{x}_0$,因$\mathrm{grad}f(\mathrm{x}_0)=0$,由Taylor公式,

$$\Delta f(\mathrm{x}_0)=f(\mathrm{x}_0+\Delta\mathrm{x})-f(\mathrm{x}_0)$$

$$=\frac{1}{2}(\Delta\mathrm{x})^{\mathrm{T}}H_f(\mathrm{x}_0)\Delta\mathrm{x}+o(\|\Delta\mathrm{x}\|^2),\ \Delta\mathrm{x}\to 0\text{时}.$$

$H_f(\mathrm{x}_0)$为实对称阵,故其所有特征值都是实的,

设为$\lambda_1 \le \lambda_2 \le \cdots \le \lambda_n$.

(1)若$H_f(\mathrm{x}_0)$正定,则$0 < \lambda_1 \le \lambda_2 \le \cdots \le \lambda_n$,

$$\Delta f(\mathrm{x}_0) \ge \frac{1}{2}\lambda_1 \|\Delta \mathrm{x}\|^2 + o(\|\Delta \mathrm{x}\|^2), \Delta \mathrm{x} \to 0\text{时},$$

因此,$\exists \delta > 0$,当$0 < \|\Delta \mathrm{x}\| < \delta$时,$\Delta f(\mathrm{x}_0) > 0$,即$\mathrm{x}_0$为$f$的严格极小值点.

(2)若$H_f(\mathrm{x}_0)$负定,则$\lambda_1 \le \lambda_2 \le \cdots \le \lambda_n < 0$. 同上可证$\mathrm{x}_0$为$f$的严格极大值点.

(3)若$H_f(\mathrm{x}_0)$不定,则$\lambda_1 < 0 < \lambda_n$.设$\alpha,\beta$为对应于$\lambda_1,\lambda_n$的单位长度的特征向量,则

$$\alpha^{\mathrm{T}} H_f(\mathrm{x}_0)\alpha = \lambda_1 \|\alpha\|^2 = \lambda_1, \quad \beta^{\mathrm{T}} H_f(\mathrm{x}_0)\beta = \lambda_n \|\beta\|^2 = \lambda_n.$$

令$\Delta \mathrm{x} = t\alpha$,则 $\Delta f(\mathrm{x}_0) = \dfrac{1}{2}\lambda_1 t^2 + o(t^2),\ t \to 0$时,

故在x_0的任意小邻域中,总$\exists \mathrm{x}, s.t. f(\mathrm{x}) < f(\mathrm{x}_0)$.

令$\Delta \mathrm{x} = t\beta$,则 $\Delta f(\mathrm{x}_0) = \dfrac{1}{2}\lambda_n t^2 + o(t^2),\ t \to 0$时,

故在x_0的任意小邻域中,总$\exists \mathrm{x}, s.t. f(\mathrm{x}) > f(\mathrm{x}_0)$.

综上,x_0不是f的极值点.□

Thm. n元函数f在x_0的邻域中二阶连续可微.

(1) $f(\mathrm{x}_0)$极小, 则$H_f(\mathrm{x}_0)$的所有特征值均≥ 0.

(2) $f(\mathrm{x}_0)$极大, 则$H_f(\mathrm{x}_0)$的所有特征值均≤ 0.

Proof: (1) $f(\mathrm{x}_0)$极小, 则$\mathrm{grad} f(\mathrm{x}_0) = 0$. 当$\Delta\mathrm{x} \to 0$时,

$$f(\mathrm{x}_0 + \Delta\mathrm{x}) - f(\mathrm{x}_0) = \frac{1}{2}(\Delta\mathrm{x})^{\mathrm{T}} H_f(\mathrm{x}_0)\Delta\mathrm{x} + o(\|\Delta\mathrm{x}\|^2).$$

若$H = H_f(\mathrm{x}_0)$有特征值$\lambda < 0$, 设$H\alpha = \lambda\alpha, \|\alpha\| = 1$, 则

$$f(\mathrm{x}_0 + t\alpha) - f(\mathrm{x}_0) = \frac{1}{2}\lambda t^2 + o(t^2), \quad (t \to 0\text{时}).$$

$|t|$充分小时, $f(\mathrm{x}_0 + t\alpha) - f(\mathrm{x}_0) < 0$, 与$f(\mathrm{x}_0)$极小矛盾.

同理可证(2).□

Remark 判断多元函数的驻点是否为极值点, 关键在于研究函数在这一点的*Hasse*矩阵的正定性.

Thm. 设$f(x,y)$在$M_0(x_0,y_0)$的邻域中二阶连续可微, $\mathrm{grad}f(x_0,y_0)=0$, 记

$$A=\frac{\partial^2 f(M_0)}{\partial x^2},B=\frac{\partial^2 f(M_0)}{\partial x\partial y},C=\frac{\partial^2 f(M_0)}{\partial y^2},$$

则1)若$A>0,AC-B^2>0$,则$f(x_0,y_0)$严格极小.

2)若$A<0,AC-B^2>0$,则$f(x_0,y_0)$严格极大.

3)若$AC-B^2<0$,则$f(x_0,y_0)$不是f的极值.

Remark: 当$AC-B^2=0$时, $f(x_0,y_0)$可能不是f的极值, 也可能是f的极大值或极小值. 例如:

$f(x,y)$	$H_f(0,0)$	$(0,0)$
x^2+y^3	$\begin{pmatrix}2 & 0\\ 0 & 0\end{pmatrix}$	不是f的极值点
$x^2+x^2y^2$	$\begin{pmatrix}2 & 0\\ 0 & 0\end{pmatrix}$	是f的极小值点.
$-x^2-x^2y^2$	$\begin{pmatrix}-2 & 0\\ 0 & 0\end{pmatrix}$	是f的极大值点.

Remark: $f \in C^2(D)$,(x_0, y_0)为D的内点, 则

$$f(x_0, y_0)\text{极小} \Rightarrow \begin{cases} f''_{xx}(x_0, y_0) \ge 0 \\ f''_{yy}(x_0, y_0) \ge 0 \end{cases}$$

$$f(x_0, y_0)\text{极大} \Rightarrow \begin{cases} f''_{xx}(x_0, y_0) \le 0 \\ f''_{yy}(x_0, y_0) \le 0 \end{cases}$$

(Hint: 考虑一元函数$f(x, y_0)$和$f(x_0, y)$的极值.)

Remark:求函数f的极值, 先求出f的所有驻点, 再逐个判断他们是否为极值点.

4.例题

例: $x^2+y^2+z^2-2x+2y-4z-10=0$确定隐函数 $z=z(x,y)$.求$z(x,y)$的极值.

分析:Step1. 求$z=z(x,y)$的驻点.

Step2.求驻点处的Hasse矩阵, 判断是否为极值点.

解:视方程

$$x^2+y^2+z^2-2x+2y-4z-10=0$$

中$z=z(x,y)$,分别对x和y求偏导,得

$$2x+2zz'_x-2-4z'_x=0 \quad (1)$$

$$2y+2zz'_y+2-4z'_y=0 \quad (2)$$

于是

$$z'_x=\frac{x-1}{2-z}, z'_y=\frac{y+1}{2-z}.$$

驻点为$(x,y)=(1,-1)$,对应$z=-2$,或$z=6$.

(1)式分别对x,y求偏导,得

$$2+2z_x'^2+2zz_{xx}''-4z_{xx}''=0,$$

$$2z_x'z_y'+2zz_{xy}''-4z_{xy}''=0,$$

(2)对y求偏导,得

$$2+2z_y'^2+2zz_{yy}''-4z_{yy}''=0.$$

当$(x,y,z)=(1,-1,-2)$时,

$$z_{xx}''=1/4, z_{xy}''=0, z_{yy}''=1/4.$$

$H=\begin{pmatrix} 1/4 & 0 \\ 0 & 1/4 \end{pmatrix}$正定,故$z=-2$为极小值.

当$(x,y,z)=(1,-1,6)$时,

$$z''_{xx}=-1/4, z''_{xy}=0, z''_{yy}=-1/4.$$

$$H=\begin{pmatrix}-1/4 & 0\\ 0 & -1/4\end{pmatrix}$$负定,故$z=6$为极大值. □

例. 求$f=(x^2+y^2)e^{-(x^2+y^2)}$的极值.

解: Step1, 求驻点.由

$$\begin{cases} f'_x=2x(1-x^2-y^2)e^{-(x^2+y^2)}=0\\ f'_y=2y(1-x^2-y^2)e^{-(x^2+y^2)}=0\end{cases}$$

得驻点(0,0)或$x^2+y^2=1$.

Step2. 求Hasse矩阵, 极值判断

$$f''_{xx}=[2(1-3x^2-y^2)-4x^2(1-x^2-y^2)]e^{-(x^2+y^2)}$$

$$f''_{yy}=[2(1-x^2-3y^2)-4y^2(1-x^2-y^2)]e^{-(x^2+y^2)}$$

$$f''_{xy}=-4xy(2-x^2-y^2)e^{-(x^2+y^2)}$$

•当$(x,y)=(0,0)$时, $f''_{xx}=2, f''_{xy}=0, f''_{yy}=2.$

$$H=\begin{pmatrix}2 & 0\\ 0 & 2\end{pmatrix}\text{正定}, f(0,0)\text{极小}.$$

• 当$x^2+y^2=1$时,

$$f''_{xx}=-4x^2e^{-1},\ f''_{xy}=-4xye^{-1},\ f''_{yy}=-4y^2e^{-1}.$$

$\det\begin{pmatrix} f''_{xx} & f''_{xy} \\ f''_{xy} & f''_{yy} \end{pmatrix}=0$, 不能直接判断$f(x,y)$是否为极值.

令$t=x^2+y^2$, 则

$$f(x,y)=(x^2+y^2)e^{-(x^2+y^2)}=te^{-t}\triangleq g(t)$$

由$g'(t)=(1-t)e^{-t}=0$得驻点$t=1$. $g''(t)=(t-2)e^{-t}$,

$g''(1)=-e^{-1}<0$. $g(t)$在$t=1$时有极大值$g(1)=e^{-1}$.

从而$f(x,y)$当$x^2+y^2=1$时有极大值e^{-1}. □

例: 求$z=x^4+y^4-2x^2+4xy-2y^2$的极值.

解: $z'_x=4x^3-4x+4y,\ \ z'_y=4y^3+4x-4y.$

得驻点$(\sqrt{2},-\sqrt{2}),(-\sqrt{2},\sqrt{2}),(0,0).$

$$z''_{xx}=12x^2-4,\quad z''_{xy}=4,\quad z''_{yy}=12y^2-4.$$

(1)在$(\sqrt{2},-\sqrt{2})$,

$$A=C=20, B=4,\ AC-B^2>0,$$

取得极小值.

(2)同理$z(x,y)$在$(-\sqrt{2},\sqrt{2})$取得极小值.

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(3)在(0,0),

$$A=C=-4, B=4,\ \ AC-B^2=0,$$

判别法失效. 由$z=x^4+y^4-2x^2+4xy-2y^2$, 有

$$z(x,x)=2x^4>0=z(0,0), \text{当}x\neq 0\text{时};$$

$$z(x,0)=x^4-2x^2$$
$$=x^2(x^2-2)<0=z(0,0), \text{当}0<x^2<2\text{时}.$$

故(0,0)不是极值点.□

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例. $\lim\limits_{\substack{(x,y)\to(0,0)\\ x\neq\sin y}} \dfrac{f(x,y)-f(0,0)}{\left(x-\sin y\right)^2} = \mathrm{A} > 0, f$连续.

$(0,0)$是否为f的极值点?

解:$\exists\delta > 0, s.t.$

$$\frac{f(x,y)-f(0,0)}{\left(x-\sin y\right)^2} > \frac{\mathrm{A}}{2}, \quad \forall x^2+y^2 \leq \delta, x \neq \sin y.$$

由f的连续性,$\forall x^2+y^2 \leq \delta$,有

$$f(x,y)-f(0,0) \geq \mathrm{A}\left(x-\sin y\right)^2/2 \geq 0.$$

故$(0,0)$为f的极小值点. □

Remark: 考虑$f(x,y)=f(0,0)+\left(x-\sin y\right)^2$.

例: f连续, $\lim\limits_{(x,y)\to(0,0)}\dfrac{f(x,y)-xy}{(x^2+y^2)^2}=1$. $f(0,0)$是否极值?

解: $\lim\limits_{(x,y)\to(0,0)}\big(f(x,y)-xy\big)=0,\ f(0,0)=0.$

存在$\varepsilon>0$, 当$x^2+y^2<\varepsilon$时,

$$\frac{3}{2}(x^2+y^2)^2>f(x,y)-xy>\frac{1}{2}(x^2+y^2)^2.$$

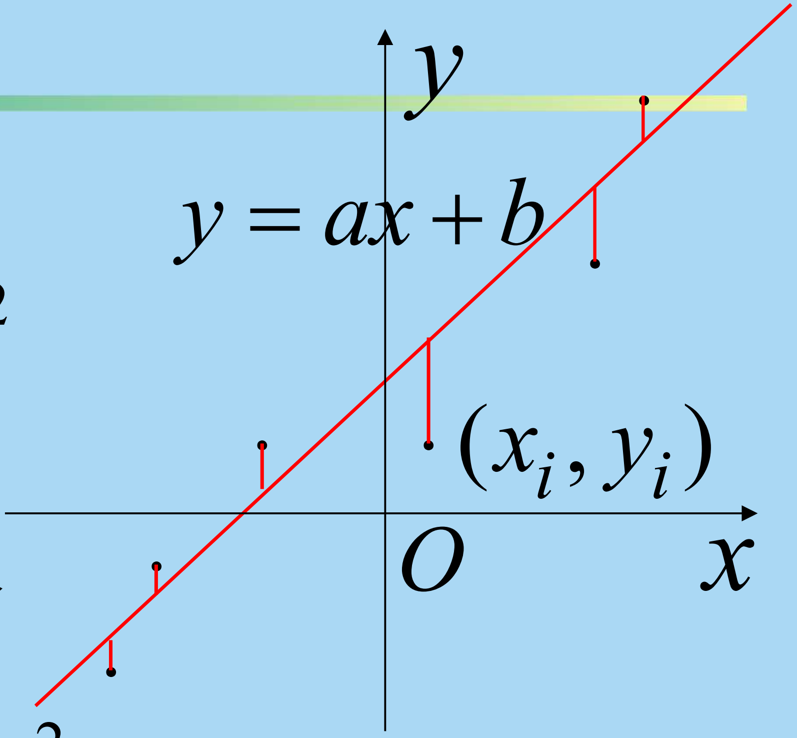
于是对充分大的n, $f\left(\dfrac{1}{n},\dfrac{1}{n}\right)>\dfrac{1}{n^2}+\dfrac{2}{n^4}>0,$

$$f\left(\frac{1}{n},-\frac{1}{n}\right)<-\frac{1}{n^2}+\frac{6}{n^4}=-\frac{1}{n^2}(1-\frac{6}{n^2})<0.$$

故$f(0,0)$不是极值. □

例. (最小二乘法)

分析: 使误差的平方和最小.



解: $f(a,b) = \sum_{i=1}^{n}[(ax_i + b) - y_i]^2$

Step1. 证明 $f(a,b)$ 有最小值.

记 $A = \sum_{i=1}^{n} x_i^2, B = \sum_{i=1}^{n} x_i$, 则

$$f(a,b) = Aa^2 + 2Bab + nb^2 + Da + Eb + G$$

且 $\lim\limits_{a^2+b^2 \to +\infty} f(a,b) = +\infty$ (留作练习题, 自证).

故 $\exists R > 0$, 当 $a^2 + b^2 > R^2$ 时, $f(a,b) > f(0,0)$. 从而 f 在 $a^2 + b^2 \le R^2$ 上的最小值就是全局最小值.

Step2.求$f(a,b)$的最小值点.由

$$\begin{cases} f_a' = -2\sum_{i=1}^{n}(y_i - ax_i - b)x_i = 0 \\ f_b' = -2\sum_{i=1}^{n}(y_i - ax_i - b) = 0 \end{cases}$$

得f的唯一驻点

$$a = \frac{n\sum_{i=1}^{n} x_i y_i - B\sum_{i=1}^{n} y_i}{nA - B^2}, b = \frac{A\sum_{i=1}^{n} y_i - B\sum_{i=1}^{n} x_i y_i}{nA - B^2}.$$

而f的最小值点必为极小值点,从而是驻点,因此f唯一的驻点就是f的最小值点.□

作业:习题1.9 No.1,2