

## Homework 6 solutions

1. a. Is  $f(x,y) = x^2 + y^3 - 3xy$  convex?

The gradient of  $f$  is  $\begin{vmatrix} 2x-3y \\ 3y^2-3x \end{vmatrix}$

So the hessian is  $\begin{vmatrix} 2 & -3 \\ -3 & 6y \end{vmatrix}$

The determinant of the hessian is  $12y-9$ . If  $y=0$ , then the determinant is negative and so the function is not convex.

2b. Is  $f(x,y,z) = x^2 + y^2 + z^2 + 6x + 6y + 6z + 2xyz$  convex?

The gradient of  $f$  is  $\begin{vmatrix} 2x+6+yz \\ 2y+6+xz \\ 2z+6+xy \end{vmatrix}$

So the hessian is  $\begin{vmatrix} 2 & 2z & 2y \\ 2z & 2 & 2x \\ 2y & 2x & 2 \end{vmatrix}$

The determinant of the first square principle diagonal matrix is 2.

The determinant of the second square principle diagonal matrix is  $4 - 4z^2$ , which is negative if  $z > 1$ , and so the function is not convex.

2. a Starting with  $x_l = -5$  and  $x_r = 11$ , perform the bisection method for 4 iterations on  $f(x) = x^4 + x^2$

$$f'(x) = 4x^3 + 2x$$

$x_{\text{left}}$	$x_{\text{mid}}$	$x_{\text{right}}$	$f'(x_{\text{mid}})$
-5	3	11	114
-5	-1	3	-6
-1	1	3	6
-1	0	1	0

Since  $f'(x_{\text{mid}}) = 0$ , a local optimal solution occurs at 0. If not I would have reported a local optimal exists between  $-1$  and  $1$  and my best guess is to let  $x=0$ .

2. b Starting with  $x_l = -5$  and  $x_r = 11$ , perform the bisection method for 4 iterations on  $f(x) = 4x^4 - x^2 + 5$

$$f'(x) = 16x^3 - 2x$$

$x_{\text{left}}$	$x_{\text{mid}}$	$x_{\text{right}}$	$f'(x_{\text{mid}})$
-5	3	11	426
-5	-1	3	-14
-1	1	3	14
-1	0	1	0

Since  $f'(x_{\text{mid}}) = 0$ , a local optimal solution occurs at 0. If not I would have reported a local optimal exists between  $-1$  and  $1$  and my best guess is to let  $x=0$ .

3a. Starting with  $x_l = -5$  and  $x_r = 11$ , perform the golden search method for 4 iterations for  $f(x) = x^4 + x^2$ .

$x_{\text{left}}$	$x_{\text{mid1}}$	$x_{\text{mid2}}$	$x_{\text{right}}$	$f(x_{\text{left}})$	$f(x_{\text{mid1}})$	$f(x_{\text{mid2}})$	$f(x_{\text{right}})$
-5	1.112	4.888	11	650	2.765585	594.7462	14762
-5	-1.22278	1.110784	4.888	650	3.730826	2.756205	594.7462
-1.22278	1.111535	2.553681	4.888	3.730826	2.761999	49.04843	594.7462
-1.22278	0.217273	1.106943	2.547	3.730826	0.049436	2.726735	48.57109

I know a local optimal solution exists between  $-1.22$  and  $1.1$ . My best guess is  $x = .217$  with a objective value of .05.

3b Starting with  $x_l = -5$  and  $x_r = 11$ , perform the golden search method for 4 iterations on  $f(x) = 4x^4 - x^2 + 5$

$x_{\text{left}}$	$x_{\text{mid1}}$	$x_{\text{mid2}}$	$x_{\text{right}}$	$f(x_{\text{left}})$	$f(x_{\text{mid1}})$	$f(x_{\text{mid2}})$	$f(x_{\text{right}})$
-5	1.112	4.888	11	2480	9.87962	2264.522	58448
-5	-1.22278	1.110784	4.888	2480	12.4473	9.855614	2264.522
-1.22278	1.111535	2.553681	4.888	12.4473	9.87044	168.5873	2264.522
-1.22278	0.217273	1.106943	2.547	12.4473	4.961707	9.780332	166.8483

I know a local optimal solution exists between  $-1.22$  and  $1.1$ . My best guess is  $x = .217$  with a objective value of 4.96.

4a. From a starting points of 0 and 1, perform the initial search algorithm to determine an optimal region for  $x^2 - 10x + 25$ .

$x_{\text{left}}$	$x_{\text{mid}}$	$x_{\text{right}}$	$f(x_{\text{left}})$	$f(x_{\text{mid1}})$	$f(x_{\text{right}})$
0	0.5	1	25	20.25	16
0	1	2	25	16	9
0	2	4	25	9	1
0	4	8	25	1	9

I know that there exists a local optimal between 0 and 8. If I wanted to find it I would use  $x_{\text{left}} = 0$  and  $x_{\text{right}} = 8$  in either bisection or the golden search methods.

4a. From a starting points of 0 and 1, perform the initial search algorithm to determine an optimal region for  $x^2 - 2x + .04$ .

xleft	xmid	xright	f(xleft)	f(xmid)	f(xright)
0	0.5	1	0.04	0.19	0.84
0	0.25	0.5	0.04	0.0525	0.19
0	0.125	0.25	0.04	0.030625	0.0525

I know that there exists a local optimal between 0 and .25. If I wanted to find it I would use  $x_{\text{left}}=0$  and  $x_{\text{right}}=.25$  in either bisection or the golden search methods.

5a. Perform two iterations of the gradient search method on  $f(x,y) = x^2 + 4xy + 2y^2 + 2x + 2y$ . Use (0,0) as a starting point.

The gradient of f is  $\begin{bmatrix} 2x+4y+2 \\ 4x+4y+2 \end{bmatrix}$

$d^1 =$  the negative of the gradient of f at the point (0,0) =  $\begin{bmatrix} -2 \\ 2 \end{bmatrix}$

So  
 $x^1 = (0,0) + \lambda(-2,2) = (-2\lambda, 2\lambda)$ .

Plugging this into  $f(x,y)$  results in  
 $f(\lambda) = 4\lambda^2 + 16\lambda^2 + 8\lambda^2 - 4\lambda - 4\lambda = 28\lambda^2 - 8\lambda$

Taking the derivative and setting it equal to 0 to find the min results in  
 $f'(\lambda) = 56\lambda - 8 = 0$   
 $\lambda = 1/7$

So  $x^1 = (-2/7, 2/7)$ .

$d^2 =$  the negative of the gradient of f at the point  $(-2/7, 2/7) = \begin{bmatrix} -2/7 \\ -2/7 \end{bmatrix}$

So  
 $x^2 = (-2/7, 2/7) + \lambda(-2/7, -2/7) = (-2/7 - 2\lambda/7, 2/7 - 2\lambda/7)$ .

Plugging this into  $f(x,y)$  results in the following simplified expression.

$f(\lambda) = -4/49\lambda^2 - 8/49\lambda - 28/49$

Taking the derivative and setting it equal to 0 to find the min results in  
 $f'(\lambda) = -8/49\lambda - 8/49 = 0$   
 $\lambda = -1$

So  $x^2 = (0, -4/7)$ .

6. Find all KKT points of  
Minimize  $-x^3 - xy$   
Subject to  $x + y = 4$   
 $x \leq 2$

So the KKT conditions are

$$\begin{array}{l} | -3x^2 - y | + u | 1 | + v | 1 | = | 0 | \\ | -x | \quad \quad \quad | 0 | + | 1 | \quad | 0 | \end{array} \quad \begin{array}{l} \text{(i)} \\ \text{(ii)} \end{array}$$

$$u(x-2)=0 \quad \text{(iii)}$$

$$u \geq 0 \quad \text{(iv)}$$

$$x \leq 2 \quad \text{(v)}$$

$$x + y = 4 \quad \text{(vi)}$$

Case 1:  $u > 0$

Thus  $x=2$ , from the (iii). By (vi)  $y=2$ . Using this in (ii) results in  $v=2$ . So plugging all of this into (i) results in  $-12-2+u+2=0$  and so  $u=12$ .

There is a KKT point at  $x=2, y=2, u=12, v=2$ . It's objective value is  $-12$ .

Case 2:  $u=0$ .

So (i) becomes  $-3x^2 - y + v = 0$ . From (ii) we get  $x=v$ , and substituting this into the new (i), we get  $-3x^2 - y + x = 0$ . From (vi) we get  $y=4-x$ . Substituting this into the most recent version of (i),  $-3x^2 - 4 + x + x = 0$ . So  $-3x^2 + 2x - 4 = 0$ . Using the quadratic formula results in  $(-2 \pm (4-48)^{1/2})/6$ . Since this is an imaginary number, there are no KKT points with  $u=0$ .

The only KKT point is at  $x=2, y=2, u=12, v=2$ . It's objective value is  $-12$ .