## Problem 1.

Consider a two dimensional space  $\mathbb{R}^2$ . Determine whether the following sets are convex or not. Prove or disprove.

- $\{(x_1, x_2): x_1^2 + x_2^2 = 1\}$
- $\{(x_1, x_2): |x_1| + |x_2| \le 1\}$

Hint: Use the triangular inequality:  $|x + y| \le |x| + |y|$ 

## Problem 2.

Consider the function  $f(x_1, x_2) = x_1^2 + x_2^2 - 4x_1x_2$ 

- a) View  $x_1$  as a variable and  $x_2$  as a constant. Determine whether f is convex in  $x_1$  and prove it.
- b) View  $x_2$  as a variable and  $x_1$  as a constant. Determine whether f is convex in  $x_2$  and prove it.
- c) View  $f: \mathbb{R}^2 \to \mathbb{R}$  as a function of the input vector  $(x_1, x_2)$ . Determine whether f is convex in  $(x_1, x_2)$  and prove it.

Hints: For a) and b), treat one variable as a constant, and calculate the second-order derivative of a single-variable function.

For c), calculate the Hessian matrix H first. You may <u>use numpy in Python to calculate</u> the eigenvalue

```
import numpy as np
from numpy import linalg as LA
H = np.array([ [11, 12], [21, 22]]) # your values here
eigenval, eigenvec = LA.eig(H)
```

Print eigenval. If any number is less than or equal to 0, Then, the function is not convex. Otherwise, it is convex. Eigenvalues may also be calculated manually.

The example shows that an element-wise convex function may not be jointly convex.

**Problem 3.** Suppose f is a differentiable convex function. Show that if f satisfies the first-order condition.

Hint:

http://www.princeton.edu/~aaa/Public/Teaching/ORF523/S16/ORF523 S16 Lec7 gh.pdf

**Problem 4.** In our proof of local optimality implying global optimality of convex functions, we define  $\lambda = \frac{\varepsilon}{2||y-x||}$  and  $z = (1 - \lambda)x + \lambda y$ . Prove that z is indeed in the  $\epsilon$ -neighbor of x.

Hint: Calculate the distance between x and y, and show it's less than  $\epsilon$ .

W2 will be due on Sep 28, extended to Sep 30 (combined with the questions in week of Sep 21 -- 23). Please check back next week.