## Homework 9:: MATH 504:: Due Tuesday, November 8th, 11:59 pm

Your homework submission must be a single pdf called "LASTNAME-hw9.pdf" with your solutions to all theory problem to receive full credit. All answers must be typed in Latex.

Consider "Rosenbrock" function

$$f(x_1, x_2) = 100(x_2 - x_1^2)^2 + (1 - x_1)^2.$$

This function is known as the banana function because of the shape of its level sets.

- a. Prove that  $x^* = [1, 1]^T$  is the unique global minimizer of f over  $\mathbb{R}^2$ .
- b. Write a method with signature function xsol = GradDescent (f, grad, x0)

The input f and grad are function handles. The function f:  $\mathbb{R}^N \to \mathbb{R}$  is an arbitrary objective function, and grad:  $\mathbb{R}^N \to \mathbb{R}^N$  is its gradient. The method should minimize f using gradient descent, and terminate when the gradient of f is small. I suggest stopping when

$$\|\nabla f(x^k)\| < \|\nabla f(x^0)\| * 10^{-4}$$

Test your algorithm on Rosenbrock function, and plot  $||x^k - x^*||_2$  versus iteration numbers k for various fixed stepsize selection of  $\alpha = 0.001, 0.05, 0.5$ , and explain your observation.

c. Modify part b to create the new function xsol = GradDescentNesterov(f, grad, x0)This function should implement Nesterov's method, that is

$$x^{k} = y^{k} - \alpha \nabla f(y^{k})$$

$$\delta^{k+1} = \frac{1 + \sqrt{1 + 4(\delta^{k})^{2}}}{2}$$

$$y^{k+1} = x^{k} + \frac{\delta^{k} - 1}{\delta^{k+1}} (x^{k} - x^{k-1})$$

The method is initialized with  $x^0 = y^1$  and  $\delta^1 = 1$ , and the first iteration has index k = 1. Test your algorithm on Rosenbrock function, and plot  $||x^k - x^*||_2$  versus iteration numbers k for various fixed stepsize selection of  $\alpha = 0.001, 0.05, 0.5$ , and explain your observation.