## IP Project 1

## Gravity Surveying Inverse Problem Analysis and Solution

Due Thursday February 16 (at class)

- If you have questions, ask them in class rather in private.
- Resources: Use any resources you choose, except other classmates and faculty. You may find information in books, papers, and on the web.
- Explain your answers for each problem, show Matlab code used in a problem (that you wrote), and use Matlab graphics when appropriate. Please do not turn in a lot of computational results. Be brief and summarize your computations with plots and tables.
- Turn in a **compact**, documented paper. If you decide to email me your paper, **please** send one file, preferably of type pdf. Also, **please** use the following naming system yourlastname\_IPproj1\_SP12.pdf

If you cannot easily put together the pdf file, hard copy will be fine.

## Problem Setup

• Refer to the emails and handouts on the gravity surveying inverse problem and the code **gravity.m**. Use the code to generate A, b, and the true solution x using:

$$[A, b, x] = gravity(n, example, 0, 1, d).$$

The matrix A will be  $n \times n$  and Toeplitz. Include in your tests below n = 32, example = 2, and depth d = .5. Experiment with various input parameters, not just those above.

## Solving the Inverse Problem

For each computed solution xc you obtain in problems 4 through 7 below, report the relative error:

$$\frac{\|xc - x\|_2}{\|x\|_2}.$$

- 1. Study experimentally how the **right-hand side** b **varies with the depth** d, for a fixed value of n. You might look at some plots of the vectors b.
- 2. Compute the **condition number, and examine how it varies** with n, for a fixed value of the depth d.
- 3. Then keep n fixed at, say 32, and study how the **condition number varies with depth** d; try to explain the observed behavior.
- 4. Compute xc first using the backslash command.

- 5. Now, solve for xc using the **truncated SVD** method. In order to "try" to find a good singular value truncation point in the SVD. You might use the command svds. Try various truncation points, including the use of the first 16 singular values only.
- 6. Compute xc using **Tikhonov regularization**. Try each of the following regularization parameters:  $\lambda = .0001, .001, .01$ , and .1. Of course you cannot use Greek letters easily in Matlab, so you might use p for  $\lambda$ .

First, se the normal equations method with the backslash command for,

$$(A^T A + \lambda^2 I)xc = A^T b.$$

Also, solve the least squares problem

$$min \| \begin{bmatrix} A \\ \lambda I \end{bmatrix} xc - \begin{bmatrix} b \\ 0 \end{bmatrix} \|_2$$

using, say, the Matlab command lsqlin. (Use doc lsqlin to see how to use the command.) Which regularization parameter  $\lambda$  gives the smallest relative error in each solution method?

7. Finally, **add noise** to the right hand side b using the following Matlab commands: s = randn(32, 1) and  $noise = eps * 10^k$ , with k = 5, 10, 12, 14 and 16. Then use

$$bn = b + s * noise$$

for the new right hand side, that is, replace b by bn.

Now, repeat problems 4, 5 and 6 above using the 5 noisy bn vectors.

Again, which regularization paramter  $\lambda$  gives the smallest relative error in each solution method?