

PSYCH-GA.2211/NEURL-GA.2201 – Fall 2014  
Mathematical Tools for Cognitive and Neural Science

## Homework 1

Due: 19 Sep 2014  
(late homeworks penalized 10% per day)

Save the solutions to each numbered problem as sections of a file called `hw1.m` in a folder called `hw1_Lastname`, along with additional files containing any functions you create. Send a zipped copy of this folder as an attachment in an email message with these attributes:

To: `catherio@nyu.edu`, `asr443@nyu.edu`

Subject: Math Tools HW1

See the course web site for full submission details. Don't wait until the day before the due date... start *now*!

1. **Inner product with a unit vector.** Given unit vector  $\hat{u}$ , and an arbitrary vector  $\vec{x}$ , write (MATLAB) expressions for computing: (a) the distance from  $\vec{x}$  to the N-1 dimensional subspace (a "hyperplane") perpendicular to  $\hat{u}$ , (b) the component of  $\vec{x}$  lying along the direction  $\hat{u}$ , (c) the component of  $\vec{x}$  that lies in the hyperplane perpendicular to  $\hat{u}$ .

Convince yourself your code is working by testing it on random vectors  $\hat{u}$  and  $\vec{x}$  (hint: generate these using `randn`, and don't forget to re-scale  $\hat{u}$  so that it has unit length). First, do this visually with 2-dimensional vectors, by plotting  $\hat{u}$ ,  $\vec{x}$ , and the two components described in (b) and (c). Then test it numerically in higher dimensions (e.g., 4) by writing (and running) expressions to verify each of the following:

- the vector in (b) is in the same direction as  $\hat{u}$
  - the length of the vector in (b) is equal to the value computed in (a)
  - the vector in (b) is perpendicular to the vector in (c)
  - the sum of the vectors in (b) and (c) is equal to  $\vec{x}$ .
2. **A simple linear system.** Suppose you have a retinal neuron whose response is a weighted sum of the intensities of light that land on 6 photoreceptors (note that these intensities are positive values). The weight vector is  $[1, 3, 5, 4, 2, 1]$ . (a) What unit-length stimulus vector elicits the largest response in the neuron? Explain how you arrived at your answer. (b) Now generate a unit-length stimulus vector that elicits a zero response in the neuron (and verify that this is true). Is this a physically realizable stimulus? Is there *any* realizable stimulus (not necessarily unit length) that would elicit a zero response in the neuron? If so, give an example.
  3. **Testing for (non)linearity.** Suppose, for each of the systems below, you observe the indicated input/output pairs of vectors (or scalars). Determine whether each system could possibly be a *linear* system. If so, provide an example of a system matrix that is consistent with the observed input/output pairs. If not, explain why.

$$\begin{array}{lll} \text{System 1:} & 1 & \longrightarrow [4, 6] \\ & 2.5 & \longrightarrow [10, 15] \end{array}$$

$$\begin{array}{lll} \text{System 2:} & [1, 2] & \longrightarrow [5, -1] \\ & [1, -1] & \longrightarrow [1, 4] \\ & [3, 0] & \longrightarrow [7, 8] \end{array}$$

$$\begin{array}{lll} \text{System 3:} & [6, 3] & \longrightarrow [12, 12] \\ & [-2, -1] & \longrightarrow [-6, -6] \end{array}$$

$$\text{System 4:} \quad 0 \longrightarrow [1, 2]$$

$$\begin{array}{lll} \text{System 5:} & [2, 4] & \longrightarrow 0 \\ & [-2, 1] & \longrightarrow 3 \end{array}$$

#### 4. Geometry of linear transformations

- Write a function `plotVec2` that takes as an argument a matrix of height 2, and plots each column vector from this matrix on 2-dimensional axes. It should check that the matrix argument has height two, signaling an error if not. Vectors should be plotted as a line from the origin to the vector position, using circle or other symbol to denote the “head” (see help for function ‘plot’). It should also draw the x and y axes, extending from -1 to 1. The two axes should be equal size, so that horizontal units are equal to vertical units (read the help for the function ‘axis’).
- Write a second function `vecLenAngle` that takes two vectors as arguments and returns the length of each vector, as well as the angle between them.
- Generate a random 2x2 matrix, and decompose it using the SVD. Now examine the action of this sequence of transformations ( $USV^T$ ) on the two “standard basis” vectors,  $\{\hat{e}_1, \hat{e}_2\}$ . Specifically, use `vecLenAngle` to examine the lengths and angle between two basis vectors  $\hat{e}_n$ , the two vectors  $V^T \hat{e}_n$ , the two vectors  $SV^T \hat{e}_n$ , and the two vectors  $USV^T \hat{e}_n$ . Do these values change, and if so, after which transformation? Verify this is consistent with their visual appearance by plotting each pair using `plotVec2`.
- Generate a matrix  $P$  with 65 columns containing 2-dimensional unit-vectors  $\hat{u}_n = [\cos(\theta_n); \sin(\theta_n)]$ , and  $\theta_n = 2\pi n/64, n = 0, 1, \dots, 64$ . [Note: Don’t use a `for` loop! Create a vector containing the values of  $\theta_n$ .] Plot a single blue curve through these points, and a red star (asterisk) at the location of the first point. As in the previous problem, apply the SVD transformations one at a time to full set of points (again, don’t use a `for` loop!), plot them, and describe what geometric changes you see (and why).