# Übungsaufgaben zur VU Computermathematik Serie 7

Here we mainly concentrate on the use of the data structures Vector and Matrix.

# Exercise 7.1: Matrix representation of a linear system.

Assume that a list is given containing m linear equations with integer coefficients in the n indexed variables  $\mathbf{x}[k], k = 1 \dots n$ .

Example (m = 2, n = 3):

[2\*x[1]+x[2]-3,x[1]-x[3]+4]

represents the system of linear equations

$$2x_1 + x_2 = 3 x_1 - x_3 = -4$$

i.e., A x = b, with

 $A = \left(\begin{array}{rrr} 2 & 1 & 0 \\ 1 & 0 & -1 \end{array}\right), \quad b = \left(\begin{array}{rrr} 3 \\ -4 \end{array}\right)$ 

a) Design a procedure which expects such a list as its argument and which returns the sequence A, b in form of a Matrix and a Vector.

Hint: Use ? coeff to extract the coefficients of the x[k].

**b**) Design a procedure for the inverse operation.

Remark: For a) it would be somewhat tricky to detect in an automatic way what the value of n (the number of variables) is. Therefore you may specify n as an additional argument to your procedure.

# Exercise 7.2: Matrix representation of a quadratic form.

Assume that a quadratic form  $q: \mathbb{R}^n \to \mathbb{R}$ , i.e., a homogenous polynomial of degree 2 in the *n* indexed variables  $\mathbf{x}[k], k = 1 \dots n$ , is given (with integer coefficients).

Example (n = 3):

 $5*x[1]^{2+4}x[1]*x[2]-x[2]*x[3]-4*x[3]^{2}$ 

a) Design a procedure which expects such an expression as its argument and which returns the unique symmetric integer  $n \times n$  - matrix Q such that  $q(x) = \frac{1}{2}x^T \cdot Q \cdot x$ .

<sup>9</sup> Here,  $x = \begin{pmatrix} x_1 \\ x_2 \\ \vdots \\ x_n \end{pmatrix}$  is a column vector, and  $x^T$  is the corresponding row vector.

Example (n = 3):

$$5x_1^2 + 4x_1x_2 - x_2x_3 - 4x_3^2 = \frac{1}{2}x^T \cdot Q \cdot x, \quad \text{with} \quad Q = \begin{pmatrix} 10 & 4 & 0 \\ 4 & 0 & -1 \\ 0 & -1 & -8 \end{pmatrix}$$

Hint: Use  $coeff(\ldots, 2)$  and  $coeff(\ldots, coeff(\ldots))$ . Again, use *n* as an additional argument to your procedure.

For testing examples, choose *n*, declare X:=Vector(*n*,symbol=x), and use LinearAlgebra[Transpose] to convert X to a row vector.

**b**) Design a procedure for the inverse operation.

## Exercise 7.3: Working with matrix functions.

A polynomial expression  $p(t) = c_0 + c_1 t + c_2 t^2 + \ldots$  can be applied to a quadratic matrix A, yielding  $p(A) = c_0 I + c_1 A + c_2 A^2 + \ldots$  (try it). In applications (like iterative methods in linear algebra), however, application of p(A) to a vector x is usually required, y := p(A) x, resulting in another vector y. This can be realized in a more efficient way.

a) Design a procedure which expects a quadratic matrix, a polynomial function, and a vector as its arguments and which returns the vector

 $p(A) x = c_0 x + c_1 A x + c_2 A^2 x + \dots$ 

For this purpose, use an efficient Horner-like evaluation scheme:

 $p(A) x = c_0 x + A (c_1 x + A(\dots))$ 

Note that this involves only matrix-vector multiplications.

Hint: Organize the evaluation using a do loop.

Use coeff. ? degree(...) returns the degree of a polynomial expression.

- **b)** Extend your procedure by a parameter check: A must be quadratic, and the dimensions of A and x must be compatible. Include two **error** exits with appropriate error messages.
- c) Let r(x) = p(x)/q(x) be a rational function.

What is r(A)? Design a procedure which computes r(A)x.

Hint: This is only well-defined if q(A) is invertible. Generate the matrix q(A) by a Horner-like scheme, evaluate p(A) x and use LinearAlgebra[LinearSolve](M,b), which computes the solution y of a linear system M y = b.

## Exercise 7.4: A special class of matrices.

a) A quadratic matrix A is called a *Toeplitz matrix* if the values  $a_{jk}$  of its entries only depend on j - k. This means that the entries take constant values along each diagonal.

Example:

 $A = \left(\begin{array}{rrrrr} 1 & 0 & 2 & 4 \\ 3 & 1 & 0 & 2 \\ 4 & 3 & 1 & 0 \\ 0 & 4 & 3 & 1 \end{array}\right)$ 

Design a procedure istoeplitz which expects a quadratic matrix as its arguments and which returns true if it is Toeplitz and false otherwise.

b) Topelitz matrices are examples of 'data-sparse' matrices: A Toeplitz matrix is uniquely defined by its first row r and its first column c (this is still slightly redundant since  $r_1 = c_1$ .)

Assume that two vectors r and c of the same length (with  $r_1 = c_1$ ) represent a Toeplitz matrix A. Design a procedure which expects r, c, and another vector x as its arguments and which computes the matrix-vector product Ax in a memory-efficient way, namely without explicitly building the matrix A.

#### Exercise 7.5: Multivariate Taylor expansion.

Let  $f : \mathbb{R}^n \to \mathbb{R}$  be a smooth scalar function in *n* variables. The Taylor polynomial of degree 2 of such a function about a point  $\xi \in \mathbb{R}^n$  looks as follows:

$$p_2(x;\xi) = f(\xi) + \underbrace{\nabla f(\xi) \cdot (x-\xi)}_{\text{linear form}} + \underbrace{\frac{1}{2} (x-\xi)^T \cdot (\nabla^T \nabla) f(\xi) \cdot (x-\xi)}_{\text{quadratic form}}$$

Here, x and  $\xi$  are to be interpreted as column vectors.  $\nabla f$  is the gradient of f, i.e., the row vector consisting of the first partial derivatives of f,

$$\nabla f(\xi) = \left(\frac{\partial f}{\partial x_1}(\xi), \dots, \frac{\partial f}{\partial x_n}(\xi)\right)$$

 $(\nabla^T \nabla) f$  is the so-called *Hessian matrix* of f; it is symmetric and contains all second partial derivatives <sup>10</sup> of f,

$$(\nabla^T \nabla) f(\xi) = \left(\begin{array}{ccc} \frac{\partial^2 f}{\partial x_1^2}(\xi) & \dots & \frac{\partial^2 f}{\partial x_1 \partial x_n}(\xi) \\ \vdots & \ddots & \vdots \\ \frac{\partial^2 f}{\partial x_n \partial x_1}(\xi) & \dots & \frac{\partial^2 f}{\partial x_n^2}(\xi) \end{array}\right)$$

a) Design a procedure ntay2 which expects a function  $f : \mathbb{R}^n \to \mathbb{R}$  and a vector  $\xi \in \mathbb{R}^n$  as its arguments and which returns the expression  $p_2(x;\xi)$  in the indexed variables  $x[1], \ldots, x[n]$  representing x.

Remark: It will be fine if you realize this for the case n = 3 only. Here it is convenient to replace the variables x[1],x[2],x[3] by x,y,z. Choose an example and compare with ? mtaylor.

b) Choose a function  $f: \mathbb{R}^2 \to \mathbb{R}$  and a point  $\xi \in \mathbb{R}^2$  (e.g.,  $\xi = (0,0)$ ), and use ? plot3d and display to plot the graphs of the functions f and  $p_2$  in a single 3D plot. Choose a plot range around the point  $\xi$  which is not too large ( $p_2$  is a local approximation to f). Furthermore, verify that all partial derivatives of  $p_2$  up to degree 2 at  $x = \xi$  coincide with the corresponding derivatives of f. (This is true by construction, according to the general principle underlying Taylor approximation.)

#### Exercise 7.6: Visualization of linear mappings via parametric plots.

An  $n \times n$ -matrix A represents a linear mapping  $x \mapsto A x$  from  $\mathbb{R}^n$  to  $\mathbb{R}^n$ . We visualize the behavior of such a mapping for n = 2 and n = 3.

a) Design a procedure expecting a numerical  $2 \times 2$ -matrix A and a positive integer M as its arguments. Use polar coordinates to generate M equally spaced points (vectors)  $x_j$  on the unit circle in  $\mathbb{R}^2$ . Apply A to all these vectors,  $y_j := A x_j$  for  $j = 1 \dots M$ . Use plots [pointplot] with option style=line and scaling=constrained to plot the resulting curve. Produce a nice plot, and also include the images of the unit vectors x = (0, 1) and x = (1, 0).

Hint: Use display. How 'smooth' the resulting plot looks like will depend on A and M.

<sup>&</sup>lt;sup>10</sup> More precisely: This matrix is symmetric if all second partial derivatives are continuous, because in this case,  $\frac{\partial^2 f}{\partial x_j \partial x_k} = \frac{\partial^2 f}{\partial x_k \partial x_j}$  (Schwarz' Theorem).

b) Realize a more 'elegant' version of such a procedure using a parametric version of ? plot.

Hint: First you have to understand how this works. Simplest example:

plot([sin(phi),cos(phi),phi=0..2\*Pi],scaling=constrained)

generates a plot of the unit circle (this corresponds to the case A = I).

c) Generalize your procedure from b) to the case n = 3, i.e., produce a 3D plot of the image of the unit ball in  $\mathbb{R}^3$  under the mapping A.

Hint: Use ? plot3d. The syntax is for a parametric 3D plot is somewhat different from the 2D case. Simplest example:

generates a 3D plot of the unit ball in  $\mathbb{R}^3$ .

d) (\*) Extend c), adding the images of the unit vectors to the plot.

#### Exercise 7.7: Verification of a simple identity in linear algebra.

Let A be an  $m \times n$ -matrix (m rows, n columns). Here we assume that m > n.

a) Choose a matrix A with integer entries and full rank n (see also LinearAlgebra[Rank]). Check the identity<sup>11</sup>

 $\mathbb{R}^m = \operatorname{image}(A) \oplus \operatorname{kernel}(A^T)$ 

where the two subspaces are orthogonal to each other,  $image(A) \perp kernel(A^T)$ .

Here, image(A) is the subspace of  $\mathbb{R}^m$  spanned by the columns of A (see LinearAlgebra[ColumnSpace]), and kernel( $A^T$ ) is the kernel of  $A^T$  (see LinearAlgebra[NullSpace]).

**b)** Repeat **a)** for a matrix with rank < n.

## Exercise 7.8: Your favorite package?

Look at the help page ? index, and select packages. Here you see a complete list of available packages.

Choose one of them, have a closer look, and prepare a small demo of its basic features.

There are many different packages. If you have no other special preference, you may take a closer look at the package geometry. *Aficionados* of combinatorics may look at combinat (see also combstruct). And there are many, many others.

 $<sup>^{11}\,\</sup>mathrm{The}$  proof of this identity is easy. But here we just 'verify' it by experiment.