## Assignment V

Exercise 1 Write a MATLAB-function which makes a page ranking of webpages.

To determine which websites are important GOOGLE uses roughly the following algorithm. First a connection matrix is made, where  $A_{ij}=1$  if page j contains a link to page i; otherwise  $A_{ij}=0$ . Next, a Markov process is considered, where you follow with probability p an arbitrary link on the current page, whereas with probability 1-p you jump to a completely arbitrary page (usually p=0.85). Let A be an  $(n \times n)$  matrix, where the j<sup>th</sup> column contains  $c_j$  1-s (i.e. page j contains  $c_j$  links). Then this Markov process is described by the matrix

$$B_{ij} = \begin{cases} \frac{p}{c_j} A_{ij} + \frac{1-p}{n} & \text{if } c_j \neq 0, \\ \frac{1}{n} & \text{if } c_j = 0. \end{cases}$$

Such a matrix (with  $B_{ij} > 0$  for all i, j) has a positive dominant eigenvalue, i.e., the eigenvalue with largest absolute value is unique, real, and positive. Moreover, the corresponding eigenvector v has strictly positive elements ( $v_j > 0$ ). This eigenvector represents the limiting long term distribution of this Markov process. The element  $v_j$  of this eigenvector is the page rank of page j.

The input variables are an  $(n \times n)$  sparse connection matrix A, and optionally a list of associated websites (a cell array with n strings). The output is a vector with page rankings. It is **important** that the input matrix can be very large (GOOGLE has  $n > 10^{10}$ ). Therefore, your function can *not* use matrix operations with full matrices. In particular, the matrix B can not even be formed.

- 1. Use the power method to determine the page rankings.
- 2. The function should also show (with bar) a picture of the result.
- 3. If the optional lists of websites is given as an input variable, the function should produce a list of the top sites (and their page rank).
- 4. On the course website you find the file wwwdata.mat containing the sparse  $(n \times n)$  matrices spn for n = 100, 500, 2000, 10000, 50000, 200000, with associated lists of websites urln. Depending on the speed and memory of your computer you can test your function on these matrices.