

---

Statistics and Numerics  
Lecture Prof. Dr. Jens Timmer  
Exercises Helge Hass, Mirjam Fehling-Kaschek  
Exercise Sheet Nr. 7

---

**Exercise 1: Maximum entropy method**

With the maximum entropy method (MEM), it is possible to construct distributions that comply with specific constraints, and contain the least a priori information. The entropy is given by

$$S = - \sum_{i=1}^N p_i \log p_i . \quad (1)$$

- a) Maximize Eq. (1) analytically with respect to the probabilities  $p_i$  of  $N$  discrete entities  $1, 2, \dots, i, \dots, N$ . Include the prior knowledge,

$$\sum_{i=1}^N p_i = 1 , \quad (2)$$

by constrained optimization (Lagrange multiplier).

- Given the symmetry of Eq. (1), what can you state about the solution?
- b) Choose  $N = 10$  and use Powell's method for a numerical optimization of Eq. (1). Note that this algorithm is normally used for minimization. Implement Powell's method for entropy maximization (Eq. (1), subject to Eq. (2)):

- Implement a function `linmin(f, a, c, tol)` that performs a golden-section search for a 1-dimensional function  $f(x) \in \mathbb{R}$ ,  $x \in [a, c] \subset \mathbb{R}$ . Use the tolerance `tol` to terminate the search algorithm once the search interval length falls below the threshold.
- Test `linmin` with the function  $f(x) = x^2$ . Does it work and what happens if the minimum of  $f(x)$  is not within  $[a, c]$ ?
- Create a two-step parameter transformation  $\vec{p} = \Theta(\vec{x})$ ,  $\vec{x} \in \mathbb{R}^N$ , satisfying the constraints  $0 \leq p_i \leq 1$  and  $\sum_{i=1}^N p_i = 1$ . The first step transforms  $x_i \in \mathbb{R} \rightarrow [0, 1]$ , and the second normalizes  $\vec{p}$ .
- Use `linmin` and the parameter transformation to minimize the function

$$-S(\vec{x}) = \sum_{i=1}^N p_i \log p_i = \sum_{i=1}^N \Theta_i(\vec{x}) \log \Theta_i(\vec{x})$$

with respect to  $\vec{x}$ . Copy the code of the solution from the lecture homepage (line 65ff.) and try to follow the procedure of Powell's method.