# Greedy algorithms for computing the Birkhoff decomposition



## Summary

A square matrix is doubly stochastic if it has nonnegative entries, and the sum of entries in any given row and any given column is equal to one. A permutation matrix is a square matrix with a single nonzero of value one in each row and each column. Birkhoff's Theorem, sometimes called the Birkhoff–von Neumann (BvN) theorem, states that any doubly stochastic matrix can be written as a convex combination of permutation matrices [1]. The BvN decomposition of a given doubly stochastic matrix is not unique, and some applications require finding the sparsest representation in which we seek the minimum number of permutation matrices. The problem of finding a BvN decomposition with the smallest number of permutation matrices is shown to be NP-hard [2] and effective heuristics are of significant interest. This internship will investigate a new family of algorithms for computing BvN decompositions based on greedy algorithms found in the sparse approximation literature [3].

[1] G. Birkhoff. Tres observaciones sobre el algebra lineal. Univ. Nac. Tucumán Rev. Ser. A, (5):147–150, 1946.

[2] F. Dufossé and B. Uçar. Notes on Birkhoff–von Neumann decomposition of doubly stochastic matrices. Linear Algebra and its Applications, 497:108–115, 2016.

[3] S. Foucart and H. Rauhut, A Mathematical Introduction to Compressive Sensing, Birkhäuser New York, NY 2013.

The internship will last 5--6 months and start in the first half of 2024 (typically February--July). It is part of the GABI project (<u>http://perso.ens-lyon.fr/bora.ucar/gabi/</u>). The internship will be carried out at LIP and CREATIS laboratories in Lyon, while the official location is LIP, ENS de Lyon.

The initial plans are as follows:

- Propose, implement, and test a greedy algorithm for the Birkhoff decomposition with the squared Euclidean norm as a loss function.

- Compare this algorithm with greedy algorithms built from the Manhattan distance ( $\ell_1$  norm). From there, depending on the preference of the intern, we may focus on:

- proving bounds on the approximation error and recovery of the true underlying number of permutations.

- proposing algorithmic strategies to improve the performance of the greedy approaches, for instance by exploring the combinatorial aspect of the problem

## Requirements

The ideal candidate is interested in the design, analysis, and implementation of algorithms and experimenting with them reproducibly. Experience in at least one of the following (Julia, Matlab, Python, C/C++) is required; **working** knowledge of linear algebra and continuous optimization algorithms is required.

#### Knowledge, skills and competences to be developed

- Sparse approximation theory
- Greedy algorithms for sparse approximation
- Numerical optimization (Linear programming, Quadratic Programming, Convex Programming)
- Development of numerical algorithms
- Scientific evaluation of algorithm performance

### Monitoring plan

Weekly meetings with the supervisors.

### **Evaluation plan**

The algorithms and codes will be developed with the standard practices of using versioncontrolling systems — this way the progress will be overseen. In the end, the demonstrated effects will set the success.

#### Payment

The standard internship gratification is available via the GABI project funded by Fédération Informatique de Lyon (FIL).

