Inria Sophia Antipolis Group: Algorithms-Biology-Structure Frederic.Cazals@inria.fr Web: http://team.inria.fr/abs



MASTER INTERNSHIP PROPOSAL

Figure 1: Exploring and mapping energy landscapes

TREKKING AND MAPPING HIGH-DIMENSIONAL LANDSCAPES

Keywords. High-dimensional spaces, exploration, random walks, probabilistic algorithms, energy land-scapes, proteins.

Context. Macroscopic properties of biomolecules result from average values computed over ensembles of conformations [1, 2]. More precisely, consider the mapping associating a potential energy to each conformation, the so-called *potential energy landscape* (PEL) (Fig. 1). The PEL encodes all properties. The structure of a macromolecular system requires characterizing conformations associated with significant (deep and/or wide) basins of local minima. In assigning occupation probabilities to these basins by integrating Boltzmann's distribution, one treats thermodynamics. Finally, transitions between such basins correspond to kinetics. Since each atom has 3 Cartesian coordinates, a shear difficulty to study PELs is their huge dimensionality, namely $d = 3n (\gg 1000)$. Fortunately, PEL exhibit a remarkable hierarchical structure [3, 4].

Goals. Algorithms exploring PEL are probabilistic algorithms sampling conformations and connecting them to build a graph-based representation. We have shown that standard methods such as basin-hopping [5], or **T-RRT** [6] follow this *sample-select-connect* template [7]. Unfortunately, nothing is known on the ability of such algorithms to discover all significant basins, letting alone their complexity.

The goal of this master will be to investigate novel ideas to analyse these exploration algorithms, with feedback on their design. The starting point will be a set of novel analysis for sampling algorithms in geometric motion planning [8, 9], carried out in the framework of geometric random graphs [10], as well as novel insights on the multiscale structure of PEL.

Conditions. Internship with *gratification*. Possibility to follow-up with a PhD thesis.

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