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1.1 Computational development

In fact, the term *computational development*, which was originally introduced in [Kum04], represents a set of techniques inspired by the biological development. In the area of the evolutionary algorithms, these techniques are interpreted as the prescriptions transforming the genotypes to the phenotypes. While the genotypes (also called *chromosomes* or *genomes* in the parlance of