

# Mathematical Models of Artificial Genetic Representations with Neutrality

Carlos M. Fonseca<sup>1</sup>, Vida Vukašinić<sup>2</sup>

<sup>1</sup> CISUC, Department of Informatics Engineering, University of Coimbra, Portugal

<sup>2</sup> Department of Computer Systems, Jožef Stefan Institute, Ljubljana, Slovenia

cmfonsec@dei.uc.pt, vida.vukasinovic@ijs.si

Kimura's neutral theory of molecular evolution [1] addresses the fact that most mutations at the genotypic level are not expressed in the phenotype, and suggests that random genetic drift is of great importance in natural evolution. Sets of genotypes connected by such neutral mutations form potentially large *neutral networks* [2] within which natural selection cannot play a direct role. However, it is understood that the accumulation of neutral mutations may potentiate the occurrence of beneficial mutations at a later stage.

Studies of neutrality in genotype-phenotype mappings have been conducted both in biology and in evolutionary computation [3]. In particular, Fonseca and Correia [4] proposed a family of uniformly redundant binary representations based on error-control codes. Such representations can exhibit various degrees of redundancy, neutrality, and other properties believed to influence the performance of evolutionary algorithms, such as connectivity, locality, and synonymity [5], and have allowed this influence to be studied experimentally to some extent [6].

In this work, a mathematical framework for the study and characterisation of Fonseca and Correia's representations is developed, leading to the definition of suitable equivalence classes and to the partitioning of the representation space with respect to neutral network structure and connectivity. The practical implications of the proposed framework are also discussed.

**Keywords:** Mathematical models; genetic representations; neutral networks; evolutionary computation.

**Acknowledgements.** This work was partially supported by a Short Term Scientific Mission (STSM) grant from COST Action CA15140 on Improving Applicability of Nature-Inspired Optimisation by Joining Theory and Practice (ImAppNIO), by national funds through the Portuguese Foundation for Science and Technology (FCT), and by the European Regional Development Fund (FEDER) through COMPETE 2020 – Operational Program for Competitiveness and Internationalisation (POCI).

## REFERENCES

- [1] M. Kimura, Evolutionary rate at molecular level, *Nature*, **217**, pp. 624-626, 1968.
- [2] P. Schuster, W. Fontana, P. F. Stadler, I. L. Hofacker, From sequences to shapes and back: A case study in RNA secondary structures, *Proceedings of the Royal Society B, Biological Sciences*, **255**, pp. 279-284, 1994.
- [3] E. Galván-López, R. Poli, A. Kattan, M. O'Neill, and A. Brabazon, Neutrality in evolutionary algorithms... What do we know?, *Evolving Systems*, **2**(3), pp. 145-163, 2011.
- [4] C. M. Fonseca and M. B. Correia, Developing redundant binary representations for genetic search, *The 2005 IEEE Congress on Evolutionary Computation*, (Edinburgh, U.K.), pp. 1675-1682, IEEE Press 2005.
- [5] F. Rothlauf, *Representations for Genetic and Evolutionary Algorithms*. Springer, 2nd Edition, 2006.
- [6] M. Correia, A study of redundancy and neutrality in evolutionary optimization, *Evolutionary Computation*, **21**(3), pp. 413-443, 2013.