

# **Studies in Computational Intelligence**

Volume 725

## **Series editor**

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Gul Muhammad Khan

# Evolution of Artificial Neural Development

In Search of Learning Genes

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## Declaration

The work presented in this book is the author's own work, unless it is stated otherwise. The following items have been previously published during this research.

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## **Hypothesis**

Is it possible to implement an autonomous computational system inspired by neuroscience capable of continuously learning and adapting in complex environments.