V.W. Porto N. Saravanan D. Waagen A.E. Eiben (Eds.)

# Evolutionary Programming VII

7th International Conference, EP98 San Diego, California, USA, March 25-27, 1998 Proceedings

In Cooperation with IEEE Neural Networks Council





Volume Editors

V.W. Porto Natural Selection Inc. 3333 North Torrey Pines Court, Suite 200, La Jolla, CA 92037, USA E-mail: bporto@natural-selection.com

N. Saravanan Ford Motor Company, 230-1 A/MD 4, ECC Building 20600 Rotunda Drive, Dearborn, MI 48121, USA E-mail: saravan@ford.com

D. Waagen Lockheed Martin Tactical Defense Systems 1300 South Litchfield Road, Goodyear, AZ 85338, USA E-mail: waagen@cyberhighway.net

A.E. Eiben Leiden University, Department of Computer Science Niels Bohrweg 1, 2333 CA Leiden, The Netherlands E-mail: gusz@wi.leidenuniv.nl

Cataloging-in-Publication data applied for

Die Deutsche Bibliothek - CIP-Einheitsaufnahme

**Evolutionary programming VII**: 7th international conference; proceedings / EP98, San Diego, California, USA, March 25 - 27, 1998. V. W. Porto ... (ed.). - Berlin ; Heidelberg ; New York ; Barcelona ; Budapest ; Hong Kong ; London ; Milan ; Paris ; Singapore ; Tokyo : Springer, 1998 (Lecture notes in computer science ; Vol. 1447) ISBN 3-540-64891-7

CR Subject Classification (1991): D.1.3, F.1-2, C.1.2, I.2.6, I.2.8, I.2.11, J.3

ISSN 0302-9743 ISBN 3-540-64891-7 Springer-Verlag Berlin Heidelberg New York

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Typesetting: Camera-ready by author SPIN 10638114 06/3142 - 5 4 3 2 1 0 Printed on acid-free paper

#### Preface

These proceedings contain the record of papers presented at the Seventh Annual Conference on Evolutionary Programming. Held March 25-27, 1998, EP98 was sponsored by the Evolutionary Programming Society in cooperation with the IEEE Neural Networks Council and the PPSN V Steering Committee. Since its inception, the purpose of this conference has been to foster communication and stimulate interactions between researchers investigating all aspects of evolutionary computation. The conference has steadily evolved into an open forum for discussing the current state of the art and future directions of evolutionary computation.

In addition to returning to San Diego, CA, for 1998, this year's conference enjoyed the largest number of papers presented and highest attendance since its inception in 1992. As part of the egalitarian nature of this conference, the papers presented span the full spectrum of evolutionary computation, including evolutionary programming, evolution strategies, genetic algorithms, genetic programming, cultural algorithms, and other variants. Special sessions on biological modeling and particle swarm augmented more traditional sessions on theory, operators, and representation. The number and wide range of applications papers presented is particularly notable. It is an important indicator that these techniques are being used successfully in real-world problem domains.

Creating a successful conference always takes a considerable effort and involves many people. The Evolutionary Programming Society would like to express its appreciation to the program committee for their diligent efforts to maintain the high quality of the papers, the conference volunteers Jacquelyn, Verna, and Eva for their cheerful, ever helpful presence, and to the team of Natural Selection, Inc., for their gracious support. Finally, special thanks go to David Fogel and Peter Angeline, whose hard work behind the scenes ensured the success of the conference.

May 1998

V. William Porto General Chairman

N. Saravanan Don Waagen A.E. Eiben Technical Co-Chairs

### **Invited Lectures and Panel Session**

#### **Keynote Lecture:**

The Symbolic Species: The Co-Evolution of Language and the Brain Terrence W. Deacon, Boston University

#### **Special Invited Lecture:**

The Cumulative Consensus of Cognitive Agents in Scenarios: A Framework for Evolutionary Processes in Semantic Memory Don Dearholt, Mississippi State University

#### **Banquet Lecture:**

Virtual Expectations Darrell Morgeson, Los Alamos National Labs

#### **Special Invited Lecture:**

Visualization of Evolutionary Algorithms in  $\mathbb{R}^n$ Roman Galar, Technical University of Wroclaw

#### **Panel Discussion:**

Evolution and Economics Panelists: Steve Bankes, Evolving Logic Associates Paul Harrald, G.E. Capital, U.K. William Morrison, University of South Carolina Leigh Tesfatsion, Iowa State University Moderator: V. William Porto, Natural Selection, Inc.

#### **Best Student Paper Awards**

An Empirical Investigation of an Evolutionary Algorithm's Ability to Maintain a Known Good Solution Thomas Kammeyer, University of California, San Diego

On the Application of Cohort-Driven Operators to Continuous Optimization Problems using Evolutionary Computation Arnold Patton, Michigan State University

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Proceedings compiled by Bill Porto and David B. Fogel

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