

Genetic Programming ~

An Introduction

On the Automatic Evolution of Computer Programs and Its Applications

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Contents

Foreword by John R. Koza	vii
Preface	xv
Acknowledgments	xix
I Prerequisites of Genetic Programming	1
1 Genetic Programming as Machine Learning	3
1.1 Motivation	4
1.2 A Brief History of Machine Learning	7
1.3 Machine Learning as a Process	9
1.4 Major Issues in Machine Learning	12
1.5 Representing the Problem	12
1.6 Transforming Solutions with Search Operators	23
1.7 The Strategy of the Search	25
1.8 Learning	28
1.9 Conclusion	29
2 Genetic Programming and Biology	33
2.1 Minimal Requirements for Evolution to Occur	35
2.2 Test Tube Evolution – A Study in Minimalist Evolution	35
2.3 The Genetic Code – DNA as a Computer Program	39
2.4 Genomes, Phenomes, and Ontogeny	45
2.5 Stability and Variability of Genetic Transmission	48
2.6 Species and Sex	53
3 Computer Science and Mathematical Basics	57
3.1 The Importance of Randomness in Evolutionary Learning	58
3.2 Mathematical Basics	60

3.3	Computer Science Background and Terminology	67
3.4	Computer Hardware	72
3.5	Computer Software	76
4	Genetic Programming as Evolutionary Computation . .	87
4.1	The Dawn of Genetic Programming — Setting the Stage	88
4.2	Evolutionary Algorithms: The General View	91
4.3	Flavors of Evolutionary Algorithms	95
4.4	Summary of Evolutionary Algorithms	102
II	Genetic Programming Fundamentals	105
5	Basic Concepts — The Foundation	107
5.1	Terminals and Functions – The Primitives of Genetic Pro- grams	109
5.2	Executable Program Structures	112
5.3	Initializing a GP Population	118
5.4	Genetic Operators	122
5.5	Fitness and Selection	126
5.6	The Basic GP Algorithm	133
5.7	An Example Run	135
6	Crossover — The Center of the Storm	143
6.1	The Theoretical Basis for the Building Block Hypothesis in GP	145
6.2	Preservation and Disruption of Building Blocks: A Gedanken Experiment	148
6.3	Empirical Evidence of Crossover Effects	151
6.4	Improving Crossover – The Argument from Biology	156
6.5	Improving Crossover – New Directions	158
6.6	Improving Crossover – A Proposal	166
6.7	Improving Crossover – The Tradeoffs	169
6.8	Conclusion	170
7	Genetic Programming and Emergent Order	175
7.1	Introduction	176
7.2	Evolution of Structure and Variable Length Genomes	177
7.3	Iteration, Selection, and Variable Length Program Structures	179

7.4	Evolvable Representations	180
7.5	The Emergence of Introns, Junk DNA, and Bloat	181
7.6	Introns in GP Defined	185
7.7	Why GP Introns Emerge	187
7.8	Effective Fitness and Crossover	188
7.9	Effective Fitness and Other Operators	190
7.10	Why Introns Grow Exponentially	191
7.11	The Effects of Introns	194
7.12	What to Do about Introns	199
8	Analysis — Improving Genetic Programming with Statistics	203
8.1	Statistical Tools for GP	205
8.2	Offline Preprocessing and Analysis	209
8.3	Offline Postprocessing	216
8.4	Analysis and Measurement of Online Data	219
8.5	Generalization and Induction	229
8.6	Conclusion	235
III	Advanced Topics in Genetic Programming	237
9	Different Varieties of Genetic Programming	239
9.1	GP with Tree Genomes	240
9.2	GP with Linear Genomes	243
9.3	GP with Graph Genomes	265
9.4	Other Genomes	267
10	Advanced Genetic Programming	277
10.1	Improving the Speed of GP	279
10.2	Improving the Evolvability of Programs	282
10.3	Improving the Power of GP Search	299
11	Implementation — Making Genetic Programming Work	309
11.1	Why Is GP so Computationally Intensive?	310
11.2	Computer Representation of Individuals	314
11.3	Implementations Using LISP	316
11.4	Some Necessary Data Structures	319
11.5	Implementations With Arrays or Stacks	325
11.6	Implementations Using Machine Code	330
11.7	A Guide to Parameter Choices	334

12	Applications of Genetic Programming	339
12.1	General Overview	340
12.2	Applications from A to Z	340
12.3	Science-Oriented Applications of GP	341
12.4	Computer Science-Oriented Applications	354
12.5	Engineering-Oriented Applications of GP	363
12.6	Summary	376
13	Summary and Perspectives	379
13.1	Summary	380
13.2	The Future of Genetic Programming	381
13.3	Conclusion	383
A	Printed and Recorded Resources	385
A.1	Books on Genetic Programming	385
A.2	GP Video Tapes	386
A.3	Books on Evolutionary Algorithms	386
A.4	Selected Journals	387
B	Information Available on the Internet	389
B.1	GP Tutorials	389
B.2	GP Frequently Asked Questions	389
B.3	GP Bibliographies	389
B.4	GP Researchers	390
B.5	General Evolutionary Computation	390
B.6	Mailing Lists	390
C	GP Software	393
C.1	Public Domain GP Systems	393
C.2	Commercial GP Software	394
C.3	Related Software Packages	394
C.4	C++ Implementation Issues	394
D	Events	395
D.1	GP Conferences	395
D.2	Related Conferences and Workshops	395
	Bibliography	399
	Person Index	445
	Subject Index	451