# Object-Oriented Implementation of Numerical Methods

An Introduction with Java and Smalltalk

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An Introduction with Java and Smalltalk

Didier H. Besset

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Code Listings xvii
Preface xxv

| 1 | Intro | oduction   | 1 |
|---|-------|--|---|
|   | 1.1   | Object-Oriented Paradigm and Mathematical Objects 2            |   |
|   | 1.2   | Object-Oriented Concepts in a Nutshell 3                       |   |
|   | 1.3   | Dealing with Numerical Data 4                                  |   |
|   |       | 1.3.1 Floating Point Representation 4                          |   |
|   |       | 1.3.2 Rounding Errors 6  |   |
|   |       | 1.3.3 Real Example of Rounding Error 7                         |   |
|   |       | 1.3.4 Outsmarting Rounding Errors 8                            |   |
|   |       | 1.3.5 Wisdom from the Past 9                                   |   |
|   | 1.4   | Finding the Numerical Precision of a Computer 10               |   |
|   |       | 1.4.1 Computer Numerical Precision—General Implementation 12   |   |
|   |       | 1.4.2 Computer Numerical Precision—Smalltalk Implementation 12 |   |
|   |       | 1.4.3 Computer Numerical Precision—Java Implementation 16      |   |
|   | 1.5   | Comparing Floating-Point Numbers 22                            |   |
|   |       | 1.5.1 Comparing Floating-Point Numbers—Smalltalk Code 23       |   |
|   | 1.6   | Speed Consideration 23   |   |
|   |       | 1.6.1 Smalltalk Particular 25                                  |   |
|   | 1.7   | Conventions 25   |   |
|   |       | 1.7.1 Class Diagrams 26  |   |
|   |       | 1.7.2 Smalltalk Code 27  |   |
|   |       | 1.7.3 Java Code 27   |   |
|   | 1.8   | Road Map 28  |   |

| 2 | Fun         | ction Evaluation  | 33         |
|---|-------------|---|------------|
|   | 2.1         | Function Concept 35   |            |
|   |             | 2.1.1 Function—Smalltalk Implementation 35  |            |
|   |             | 2.1.2 Function—Java Implementation 36   |            |
|   | 2.2         | Polynomials 39  |            |
|   |             | 2.2.1 Mathematical Definitions 39   |            |
|   |             | 2.2.2 Polynomials—General Implementation 41   |            |
|   |             | 2.2.3 Polynomials—Smalltalk Implementation 42   |            |
|   |             | 2.2.4 Polynomials—Java implementation 48  |            |
|   | 2.3         | Error Function 56   |            |
|   |             | 2.3.1 Mathematical Definitions 56   |            |
|   |             | 2.3.2 Error Function—Smalltalk Implementation 58  |            |
|   |             | 2.3.3 Error Function—Java Implementation 60   |            |
|   | 2.4         | Gamma Function 62   |            |
|   |             | 2.4.1 Mathematical Definitions 62   |            |
|   |             | 2.4.2 Gamma Function—Smalltalk Implementation 64  |            |
|   |             | 2.4.3 Gamma Function—Java Implementation 66   |            |
|   | 2.5         | Beta Function 69  |            |
|   |             | 2.5.1 Mathematical Definitions 69   |            |
|   |             | 2.5.2 Beta Function—Smalltalk Implementation 70   |            |
|   |             | 2.5.3 Beta Function—Java Implementation 70  |            |
| 3 | Inte        | rpolation   | <b>7</b> 3 |
|   | 3.1         | General Remarks 74  |            |
|   | 3.1         | 3.1.1 Interpolation Concepts and Examples 74  |            |
|   | 3.2         | Lagrange Interpolation 78   |            |
|   | J. <u>Z</u> | 3.2.1 Lagrange Interpolation—Smalltalk Implementation 80  |            |
|   |             | 3.2.2 Lagrange Interpolation—Java Implementation 83   |            |
|   | 3.3         | Newton Interpolation 88   |            |
|   | 3.3         |   |            |
|   |             | 3.3.1 Newton Interpolation—General Implementation 88 3.3.2 Newton Interpolation—Smalltalk Implementation 89   |            |
|   |             | 3.3.3 Newton Interpolation—Java Implementation 90   |            |
|   | 3.4         | Neville Interpolation 92  |            |
|   | J.T         | •   |            |
|   |             | 3.4.1 Neville Interpolation—General Implementation 93 3.4.2 Neville Interpolation—Smalltalk Implementation 94 |            |
|   |             | 5.1.2 Preside Interpolation—Smallack Implementation 74  |            |

vi

Contents

|   |       | 3.4.3 Neville Interpolation—Java Implementation 96              |      |
|---|-------|---|------|
|   | 3.5   | Bulirsch-Stoer Interpolation 98                                 |      |
|   |       | 3.5.1 Bulirsch-Stoer Interpolation—General Implementation 100   |      |
|   |       | 3.5.2 Bulirsch-Stoer Interpolation—Smalltalk Implementation 100 | )    |
|   |       | 3.5.3 Bulirsch-Stoer Interpolation—Java Implementation 101      |      |
|   | 3.6   | Cubic Spline Interpolation 102                                  |      |
|   |       | 3.6.1 Cubic Spline Interpolation—General Implementation 103     |      |
|   |       | 3.6.2 Cubic Spline Interpolation—Smalltalk Implementation 104   |      |
|   |       | 3.6.3 Cubic Spline Interpolation—Java Implementation 107        |      |
|   | 3.7   | Which Method to Choose? 110                                     |      |
| 4 | Itomo | tivo Algorithms   | 11.0 |
| 4 |       | ttive Algorithms  | 113  |
|   | 4.1   | Successive Approximations 113                                   |      |
|   |       | 4.1.1 Iterative Process—Smalltalk Implementation 117            |      |
|   |       | 4.1.2 Iterative Process—JAVA Implementation 121                 |      |
|   | 4.2   | Evaluation with Relative Precision 126                          |      |
|   |       | 4.2.1 Relative Precision—Smalltalk Implementation 126           |      |
|   |       | 4.2.2 Relative Precision—Java Implementation 128                |      |
|   | 4.3   | Examples 130  |      |
| 5 | Find  | ling the Zero of a Function                                     | 133  |
|   | 5.1   | Introduction 133  |      |
|   | 5.2   | Finding the Zeroes of a Function—Bisection Method 134           |      |
|   |       | 5.2.1 Bisection Algorithm—General Implementation 136            |      |
|   |       | 5.2.2 Bisection Algorithm—Smalltalk Implementation 136          |      |
|   |       | 5.2.3 Bisection Algorithm—Java Implementation 138               |      |
|   | 5.3   | Finding the Zero of a Function—Newton's Method 140              |      |
|   |       | 5.3.1 Newton's Method—Smalltalk Implementation 142              |      |
|   |       | 5.3.2 Newton's Method—Java Implementation 144                   |      |
|   | 5.4   | Example of Zero Finding—Roots of Polynomials 147                |      |
|   |       | 5.4.1 Roots of Polynomials—Smalltalk Implementation 148         |      |
|   |       | 5.4.2 Roots of Polynomials—Java Implementation 149              |      |
|   | 5.5   | Which Method to Choose? 150                                     |      |
|   |       |   |      |

| 6 | Integ    | gration of Functions   | 153 |
|---|----------|--|-----|
|   | 6.1      | Introduction 153   |     |
|   | 6.2      | General Framework—Trapeze Integration Method 155   |     |
|   |          | 6.2.1 End Game Strategy 157  |     |
|   |          | 6.2.2 Trapeze Integration—General Implementation 157   |     |
|   |          | 6.2.3 Trapeze Integration—Smalltalk Implementation 158   |     |
|   |          | 6.2.4 Trapeze Integration—Java Implementation 160  |     |
|   | 6.3      | Simpson Integration Algorithm 162  |     |
|   |          | 6.3.1 Simpson Integration—General Implementation 163   |     |
|   |          | 6.3.2 Simpson Integration—Smalltalk Implementation 163   |     |
|   | <i>c</i> | 6.3.3 Simpson Integration—Java Implementation 164  |     |
|   | 6.4      | Romberg Integration Algorithm 165  |     |
|   |          | 6.4.1 Romberg Integration—General Implementation 166   |     |
|   |          | 6.4.2 Romberg Integration—Smalltalk Implementation 167 6.4.3 Romberg Integration—Java Implementation 168 |     |
|   | 6.5      | Evaluation of Open Integrals 170   |     |
|   | 0.3      | 6.5.1 Bag of Tricks 170  |     |
|   | 6.6      | Which Method to Choose? 171  |     |
|   | 0.0      | 6.6.1 Smalltalk Comparison 171   |     |
|   |          | 6.6.2 Java Comparison 173  |     |
|   |          |  |     |
| 7 | Serie    | es   | 177 |
|   | 7.1      | Introduction 177   |     |
|   | 7.2      | Infinite Series 178  |     |
|   |          | 7.2.1 Infinite Series—Smalltalk Implementation 181   |     |
|   |          | 7.2.2 Infinite Series—Java Implementation 183  |     |
|   | 7.3      | Continued Fractions 184  |     |
|   |          | 7.3.1 Continued Fractions—Smalltalk Implementation 185   |     |
|   |          | 7.3.2 Continued Fractions—Java Implementation 186  |     |
|   | 7.4      | Incomplete Gamma Function 188  |     |
|   |          | 7.4.1 Mathematical Definitions 189   |     |
|   |          | r  | 190 |
|   |          | 7.4.3 Incomplete Gamma Function—Java Implementation 193  |     |
|   | 7.5      | Incomplete Beta Function 198   |     |

7.5.1 Mathematical Definitions 199

Contents ix

7.5.2 Incomplete Beta Function—Smalltalk Implementation 199
 7.5.3 Incomplete Beta Function—Java Implementation 202

| Line | ear Al                       | gebra   | 207 |
|------|------------------------------|---|-----|
| 8.1  | 3.1 Vectors and Matrices 209 |   |     |
|      | 8.1.1                        | Vector and Matrix—Smalltalk Implementation 212          |     |
|      | 8.1.2                        | Vector and Matrix—Java Implementation 222               |     |
| 8.2  | Linea                        | r Equations 242   |     |
|      | 8.2.1                        | Backward Substitution 243                               |     |
|      | 8.2.2                        | Gaussian Elimination 244                                |     |
|      | 8.2.3                        | Fine Points 245   |     |
|      | 8.2.4                        | Linear Equations—General Implementation 246             |     |
|      | 8.2.5                        | Linear Equations—Smalltalk Implementation 246           |     |
|      | 8.2.6                        | Linear Equations—Java Implementation 250                |     |
| 8.3  | LUP I                        | Decomposition 257                                       |     |
|      | 8.3.1                        | LUP Decomposition—General Implementation 259            |     |
|      | 8.3.2                        | LUP Decomposition—Smalltalk Implementation 260          |     |
|      | 8.3.3                        | LUP Decomposition—Java Implementation 264               |     |
| 8.4  | Comp                         | outing the Determinant of a Matrix 272                  |     |
|      | 8.4.1                        | Computing the Determinant of Matrix—General             |     |
|      |                              | Implementation 273                                      |     |
|      | 8.4.2                        | Computing the Determinant of Matrix—Smalltalk           |     |
|      |                              | Implementation 273                                      |     |
|      | 8.4.3                        | Computing the Determinant of Matrix—Java Implementation | 274 |
| 8.5  | Matri                        | x Inversion 274   |     |
|      | 8.5.1                        | Implementation Strategy 275                             |     |
|      | 8.5.2                        | Matrix Inversion—Smalltalk Implementation 277           |     |
|      | 8.5.3                        | Matrix Inversion—Java Implementation 279                |     |
|      | 8.5.4                        | Matrix Inversion—Rounding Problems 287                  |     |
| 8.6  | Matri                        | x Eigenvalues and Eigenvectors of a Nonsymmetrical      |     |
|      | Matri                        | x 288   |     |
|      | 8.6.1                        | Finding the Largest Eigenvalue—General Implementation 2 | 89  |
|      | 8.6.2                        | Finding the Largest Eigenvalue—Smalltalk Implementation | 290 |
|      | 8.6.3                        | Finding the Largest Eigenvalue—Java Implementation 292  |     |
| 8.7  | Matri                        | x Eigenvalues and Eigenvectors of a Symmetrical Matrix  | 296 |
|      | 8.7.1                        | Jacobi's Algorithm 299                                  |     |

|      | 8.7.2  | Jacobi's Algorithm—General Implementation 300          |
|------|--------|--|
|      | 8.7.3  | Jacobi's Algorithm—Smalltalk Implementation 300        |
|      | 8.7.4  | Jacobi's Algorithm—Java Implementation 305             |
| Elen | ients  | of Statistics 311                                      |
| 9.1  | Statis | tical Moments 311                                      |
|      | 9.1.1  | Statistical Moments—General Implementation 314         |
|      | 9.1.2  | Statistical Moments—Smalltalk Implementation 315       |
|      | 9.1.3  | Statistical Moments—Java Implementation 317            |
| 9.2  | Robu   | st Implementation of Statistical Moments 320           |
|      | 9.2.1  | Robust Central Moments—General Implementation 322      |
|      | 9.2.2  | Robust Central Moments—Smalltalk Implementation 322    |
|      | 9.2.3  | Robust Central Moments—Java Implementation 326         |
| 9.3  | Histo  | grams 331  |
|      | 9.3.1  | Histograms—General Implementation 333                  |
|      | 9.3.2  | Histograms—Smalltalk Implementation 333                |
|      | 9.3.3  | Histograms—Java Implementation 343                     |
| 9.4  | Rand   | om Number Generator 358                                |
|      | 9.4.1  | Linear Congruential Random Generators 358              |
|      | 9.4.2  | Additive Sequence Generators 359                       |
|      | 9.4.3  | Bit-Pattern Generators 360                             |
|      |        | Random Number Generator—Smalltalk Implementation 361   |
|      | 9.4.5  | Random Number Generator—Java Implementation 366        |
| 9.5  | Proba  | ability Distributions 369                              |
|      | 9.5.1  | Probability Distributions—General Implementation 371   |
|      | 9.5.2  | Probability Distributions—Smalltalk Implementation 371 |
|      | 9.5.3  | Probability Distributions—Java Implementation 376      |
| 9.6  | Norn   | nal Distribution 384                                   |
|      | 9.6.1  | Normal Distribution—Smalltalk Implementation 384       |
|      | 9.6.2  | Normal Distribution—Java Implementation 387            |
| 9.7  | Gamı   | ma Distribution 392                                    |
|      | 9.7.1  | Gamma Distribution—Smalltalk Implementation 392        |
|      | 9.7.2  | Gamma Distribution—Java Implementation 397             |
| 9.8  | Expe   | rimental Distribution 403                              |
|      | 9.8.1  | Experimental Distribution—General Implementation 403   |
|      | 9.8.2  | Experimental Distribution—Smalltalk Implementation 404 |

Contents xi

9.8.3 Experimental Distribution—Java Implementation 406

| Stati | Statistical Analysis 411  |   |  |  |
|-------|---|---|--|--|
| 10.1  | <i>F</i> -Test and the Fisher-Snedecor Distribution 413           |   |  |  |
|       | 10.1.1 Fisher-Snedecor Distribution—Smalltalk Implementation 414  | ł |  |  |
|       | 10.1.2 Fisher-Snedecor Distribution—Java Implementation 419       |   |  |  |
| 10.2  | <i>t</i> -Test and the Student Distribution 424                   |   |  |  |
|       | 10.2.1 Student Distribution—Smalltalk Implementation 426          |   |  |  |
|       | 10.2.2 Student Distribution—Java Implementation 431               |   |  |  |
| 10.3  | $\chi^2$ -Test and $\chi^2$ Distribution 436                      |   |  |  |
|       | 10.3.1 $\chi^2$ Distribution—Smalltalk Implementation 439         |   |  |  |
|       | 10.3.2 $\chi^2$ Distribution—Java Implementation 440              |   |  |  |
|       | 10.3.3 Weighted-Point Implementation 442                          |   |  |  |
| 10.4  | $\chi^2$ -Test on Histograms 448                                  |   |  |  |
|       | 10.4.1 $\chi^2$ -Test on Histograms—Smalltalk Implementation 450  |   |  |  |
|       | 10.4.2 χ <sup>2</sup> -Test on Histograms—Java Implementation 453 |   |  |  |
| 10.5  | Definition of Estimation 456                                      |   |  |  |
|       | 10.5.1 Maximum-Likelihood Estimation 457                          |   |  |  |
|       | 10.5.2 Least-Square Estimation 457                                |   |  |  |
| 10.6  | Least-Square Fit with Linear Dependence 459                       |   |  |  |
| 10.7  | Linear Regression 460   |   |  |  |
|       | 10.7.1 Linear Regression—General Implementation 462               |   |  |  |
|       | 10.7.2 Linear Regression—Smalltalk Implementation 462             |   |  |  |
|       | 10.7.3 Linear Regression—Java Implementation 466                  |   |  |  |
| 10.8  | Least-Square Fit with Polynomials 471                             |   |  |  |
|       | 10.8.1 Polynomial Least-Square Fits—Smalltalk Implementation 47   | 4 |  |  |
|       | 10.8.2 Polynomial Least-Square Fits—Java Implementation 478       |   |  |  |
| 10.9  | Least-Square Fit with Nonlinear Dependence 482                    |   |  |  |
|       | 10.9.1 Nonlinear Fit—General Implementation 484                   |   |  |  |
|       | 10.9.2 Nonlinear Fit—Smalltalk Implementation 485                 |   |  |  |
|       | 10.9.3 Nonlinear Fit—Java Implementation 489                      |   |  |  |
| 10.10 | Maximum-Likelihood Fit of a Probability Density Function 49       | 9 |  |  |
|       | 10.10.1 Maximum-Likelihood Fit—General Implementation 501         |   |  |  |
|       | 10.10.2 Maximum-Likelihood Fit—Smalltalk Implementation 502       |   |  |  |
|       | 10.10.3 Maximum-Likelihood Fit—Java Implementation 505            |   |  |  |

11

| <b>Opti</b> | otimization 511  |  |  |
|-------------|--|--|--|
| 11.1        | Introduction 514   |  |  |
| 11.2        | Extended Newton Algorithms 515   |  |  |
| 11.3        | Hill-Climbing Algorithms 516   |  |  |
|             | 11.3.1 Optimizing—General Implementation 517   |  |  |
|             | 11.3.2 Common Optimizing Classes—Smalltalk Implementation 518  |  |  |
|             | 11.3.3 Common Optimizing Classes—Java Implementation 524   |  |  |
| 11.4        | Optimizing in One Dimension 540  |  |  |
|             | 11.4.1 Optimizing in One Dimension—Smalltalk Implementation 540  |  |  |
|             | 11.4.2 Optimizing in One Dimension—Java Implementation 543   |  |  |
| 11.5        | Bracketing the Optimum in One Dimension 546  |  |  |
|             | 11.5.1 Bracketing the Optimum—Smalltalk Implementation 546   |  |  |
|             | 11.5.2 Bracketing the Optimum—Java Implementation 548  |  |  |
| 11.6        | Powell's Algorithm 550   |  |  |
|             | 11.6.1 Powell's Algorithm—General Implementation 551   |  |  |
|             | 11.6.2 Powell's Algorithm—Smalltalk Implementation 552   |  |  |
|             | 11.6.3 Powell's Algorithm—Java Implementation 554  |  |  |
| 11.7        | Simplex Algorithm 558  |  |  |
|             | 11.7.1 Simplex Algorithm—General Implementation 560  |  |  |
|             | 11.7.2 Simplex Algorithm—Smalltalk Implementation 560  |  |  |
| 11.0        | 11.7.3 Simplex Algorithm—Java Implementation 563   |  |  |
| 11.8        | Genetic Algorithm 568  |  |  |
|             | 11.8.1 Mapping the Search Space on Chromosomes 569   |  |  |
|             | 11.8.2 Genetic Algorithm—General Implementation 569 11.8.3 Genetic Algorithm—Smalltalk Implementation 573      |  |  |
|             | 11.8.5 Genetic Algorithm—Smattaik Implementation 375 11.8.4 Genetic Algorithm—Java Abstract Implementation 578 |  |  |
|             | 11.8.5 Genetic Algorithm—Java Implementation with Vectors 585  |  |  |
| 11.9        | Multiple Strategy Approach 592   |  |  |
|             | 11.9.1 Multiple Strategy Approach—General Implementation 593   |  |  |
|             |  |  |  |
| Data        | Mining 599   |  |  |
|             | 8  |  |  |
| 12.1        | Data Server 601  |  |  |
|             | 12.1.1 Data Server—Smalltalk Implementation 602  |  |  |
| 12.2        | 12.1.2 Data Server—Java Implementation 603   |  |  |
| 12.2        | Covariance and Covariance Matrix 605   |  |  |

Contents xiii

|       | 12.2.1 Using Covariance Information 607                  |
|-------|--|
|       | 12.2.2 Covariance Matrix—General Implementation 607      |
|       | 12.2.3 Covariance Matrix—Smalltalk Implementation 608    |
|       | 12.2.4 Covariance Matrix—Java Implementation 611         |
| 12.3  | Multidimensional Probability Distribution 616            |
| 12.4  | Covariance Data Reduction 617                            |
| 12.5  | Mahalanobis Distance 617                                 |
|       | 12.5.1 Examples of Use 618                               |
|       | 12.5.2 Mahalanobis Distance—General Implementation 619   |
|       | 12.5.3 Mahalanobis Distance—Smalltalk Implementation 620 |
|       | 12.5.4 Mahalanobis Distance—Java Implementation 622      |
| 12.6  | Cluster Analysis 625                                     |
|       | 12.6.1 Algorithm Details 625                             |
|       | 12.6.2 Cluster Analysis—General Implementation 627       |
|       | 12.6.3 Cluster Analysis—Smalltalk Implementation 629     |
|       | 12.6.4 Cluster Analysis—Java Implementation 634          |
| 12.7  | Covariance Clusters 643                                  |
|       | 12.7.1 Covariance Clusters—General Implementation 643    |
| Decir | mal Floating-Point Simulation 647                        |
|       |  |
| Smal  | ltalk Primer for Java Programmers 651                    |
| B.1   | Syntax in a Nutshell 651                                 |
|       | B.1.1 Smalltalk Expressions 651                          |
|       | B.1.2 Precedence 652                                     |
|       | B.1.3 Assignment, Equality, and Identity 653             |
| B.2   | Class and Methods 653                                    |
|       | B.2.1 Instance Methods 654                               |
|       | B.2.2 Class Methods 655                                  |
|       | B.2.3 Block Context 656                                  |
| B.3   | Iterator Methods 657                                     |
|       | B.3.1 do: 657  |
|       | B.3.2 collect: 657                                       |
|       | B.3.3 inject:into: 657                                   |
| B.4   | Double Dispatching 658                                   |
| B.5   | Multiple Dispatching 660                                 |

App. A

App. B

| App. C | Java              | Primer for Smalltalk Programmers 661  |
|--------|-------------------|---|
|        | C.2<br>C.3<br>C.4 | Remarks on the Syntax 661  C.1.1 Classes 662  C.1.2 Instance Variables 662  C.1.3 Method Declaration and Method Calling 662  C.1.4 Objects and Nonobjects 663  C.1.5 Packages 663  C.1.6 Scope qualifiers 664  C.1.7 Static Qualifier 666  Abstract Class and Interface 666  Exception Handling 668  Collections and Related Topics 669 |
| App. D | Addi              | itional Probability Distributions 671   |
|        | D.1               | Beta Distribution 671  D.1.1 Beta Distribution—Smalltalk Implementation 671   |
|        | D.2               | D.1.2 Beta Distribution—Java Implementation 675  Cauchy Distribution 680  D.2.1 Cauchy Distribution—Smalltalk Implementation 681  |
|        | D.3               | D.2.2 Cauchy Distribution—Java Implementation 683  Exponential Distribution 687  D.3.1 Exponential Distribution—Smalltalk Implementation 688  |
|        | D.4               | D.3.2 Exponential Distribution—Java Implementation 690 Fisher-Tippett Distribution 694  |
|        | D.5               | D.4.1 Fisher-Tippett Distribution—Smalltalk Implementation 694 D.4.2 Fisher-Tippett Distribution—Java Implementation 698 Laplace Distribution 702   |
|        | D. (              | D.5.1 Laplace Distribution—Smalltalk Implementation 702 D.5.2 Laplace Distribution—Java Implementation 705  |
|        | D.6               | Log Normal Distribution 710  D.6.1 Log Normal Distribution—Smalltalk Implementation 710  D.6.2 Log Normal Distribution—Java Implementation 713  |
|        | D.7               | Triangular Distribution 716  D.7.1 Triangular Distribution—Smalltalk Implementation 716  D.7.2 Triangular Distribution—Java Implementation 719  |

Contents xv

| D.8  | Uniform Distribution 723                                |
|------|---|
|      | D.8.1 Uniform Distribution—Smalltalk Implementation 723 |
|      | D.8.2 Uniform Distribution—Java Implementation 725      |
| D.9  | Weibull Distribution 728                                |
|      | D.9.1 Weibull Distribution—Smalltalk Implementation 730 |
|      | D.9.2 Weibull Distribution—Java Implementation 732      |
|      |   |
| Accı | urate Accumulation of Expectation Values 737            |
| E.1  | Accurate Accumulation of Central Moments 737            |
| E.2  | Accurate Accumulation of the Covariance 739             |

## App. F Accompanying CD ROM 741

- F.1 Smalltalk code 741

  F.1.1 non-ENVY users 741

  F.1.2 ENVY users 743

  F.2 Java code 744

  F.2.1 Visual Age for Java 744

  F.2.2 Other Java systems 744
- F.3 Utilities 745 F.3.1 Distribution demo 745 F.3.2 File reader 745

References 747 Index 749

App. E

# Code Listings

| 4 |      |  |
|---|------|--|
| 1 | 1.1  | Smalltalk code to find the machine precision 12                    |
|   | 1.2  | Java code to find the machine precision 16                         |
|   | 1.3  | Comparison of floating-point numbers in Smalltalk 23               |
|   |      |  |
| 2 | 2.1  | Java implementation of the interface OneVariableFunction 36        |
|   | 2.2  | Java implementation of a generic derivative evaluation 37          |
|   | 2.3  | Smalltalk implementation of the polynomial class 43                |
|   | 2.4  | Method of class Number related to polynomials 47                   |
|   | 2.5  | Java implementation of the polynomial class 48                     |
|   | 2.6  | Smalltalk implementation of the Error function 59                  |
|   | 2.7  | Java implementation of the Error function (partial listing) 61     |
|   | 2.8  | Smalltalk implementation of the gamma function 64                  |
|   | 2.9  | Java implementation of the gamma function 67                       |
|   | 2.10 | Smalltalk implementation of the beta function 70                   |
|   |      |  |
| 3 | 3.1  | Smalltalk implementation of the Lagrange interpolation 81          |
|   | 3.2  | Java interface for point series 83                                 |
|   | 3.3  | A possible concrete implementation of the interface PointSeries 84 |
|   | 3.4  | Java implementation of the Lagrange interpolation 86               |
|   | 3.5  | Smalltalk implementation of the Newton interpolation 89            |
|   | 3.6  | Java implementation of the Newton interpolation 91                 |
|   | 3.7  | Smalltalk implementation of Neville's algorithm 94                 |
|   | 3.8  | Java implementation of Neville interpolation 96                    |
|   | 3.9  | Smalltalk implementation of Bulirsch-Stoer interpolation 100       |
|   | 3.10 | Java implementation of Bulirsch-Stoer interpolation 101            |
|   | 3.11 | Smalltalk implementation of cubic spline interpolation 104         |
|   | 3.12 | Java implementation of cubic spline interpolation 107              |

| 4 | 4.1  | Smalltalk implementation of an iterative process 119  |
|---|------|---|
|   | 4.2  | Java implementation of an iterative process 123   |
|   | 4.3  | Smalltalk implementation of the class DhbFunctionalIterator 127                             |
|   | 4.4  | Java implementation of the class FunctionalIterator 129                                     |
| 5 | 5.1  | Smalltalk implementation of the bisection algorithm 137                                     |
|   | 5.2  | Java implementation of a generic derivative evaluation 139                                  |
|   | 5.3  | Smalltalk implementation of Newton's zero-finding method 143                                |
|   | 5.4  | Java implementation of Newton's zero-finding method 145                                     |
|   | 5.5  | Smalltalk implementation of finding the roots of a polynomial 148                           |
| 6 | 6.1  | Smalltalk implementation of trapeze integration 159   |
|   | 6.2  | Java implementation of trapeze integration 161  |
|   | 6.3  | Smalltalk implementation of the Simpson integration algorithm 164                           |
|   | 6.4  | Java implementation of the Simpson integration algorithm 164                                |
|   | 6.5  | Smalltalk implementation of Romberg integration 167   |
|   | 6.6  | Java implementation of Romberg integration 168  |
|   | 6.7  | Smalltalk comparison script for integration algorithms 172                                  |
|   | 6.8  | Java comparison method for integration algorithms 173                                       |
| 7 | 7.1  | Smalltalk implementation of an infinite series 181  |
|   | 7.2  | Smalltalk implementation of a term server 182   |
|   | 7.3  | Java implementation of an infinite series 183   |
|   | 7.4  | Smalltalk implementation of a continued fraction 186  |
|   | 7.5  | Java implementation of an infinite series 186   |
|   | 7.6  | Smalltalk implementation of the incomplete gamma function 191                               |
|   | 7.7  | Smalltalk implementation of the series term server for the incomplete gamma function 192    |
|   | 7.8  | Smalltalk implementation of the fraction term server for the incomplete gamm function 193   |
|   | 7.9  | Java implementation of the incomplete gamma function 194                                    |
|   | 7.10 | Java implementation of the infinite series term server for the incomplete gamm function 196 |
|   | 7.11 | Java implementation of the fraction term server for the incomplete gamma function 197       |
|   | 7.12 | Smalltalk implementation of the incomplete beta function 200                                |
|   | 7.13 | Smalltalk implementation of the term server for the incomplete beta function 201            |
|   | 7.14 | Java implementation of the incomplete beta function 202                                     |

xviii

Code Listings xix

|   | /.13 | function 204  |
|---|------|---|
| 8 | 8.1  | Vector class in Smalltalk 214   |
|   | 8.2  | Matrix classes in Smalltalk 217   |
|   | 8.3  | Symmetrical matrix classes in Smalltalk 221   |
|   | 8.4  | Mathematical vector class in Java 224   |
|   | 8.5  | Matrix class in Java 232  |
|   | 8.6  | Smalltalk implementation of a system of linear equations 247                                  |
|   | 8.7  | Java implementation of a system of linear equations 252                                       |
|   | 8.8  | Smalltalk implementation of the LUP decomposition 261   |
|   | 8.9  | Java implementation of the LUP decomposition 266  |
|   | 8.10 | Smalltalk methods to compute a matrix determinant 273   |
|   | 8.11 | Smalltalk implementation of matrix inversion 277  |
|   | 8.12 | Java implementation of the class SymmetricMatrix 280  |
|   | 8.13 | Smalltalk implementation of the search for the largest eigenvalue 291                         |
|   | 8.14 | Java implementation of the search for the largest eigenvalue 293                              |
|   | 8.15 | Smalltalk implementation of Jacobi's algorithm 301  |
|   | 8.16 | Java implementation of Jacobi's algorithm 306   |
| 9 | 9.1  | Smalltalk fast implementation of statistical moments 315                                      |
|   | 9.2  | Java implementation of statistical moments 317  |
|   | 9.3  | Smalltalk implementation of accurate statistical moments 322                                  |
|   | 9.4  | Smalltalk implementation of accurate statistical moments with fixed orders 325                |
|   | 9.5  | Java implementation of accurate statistical moments 326                                       |
|   | 9.6  | Java implementation of accurate statistical moments with fixed order 330                      |
|   | 9.7  | Smalltalk implementation of histograms 336  |
|   | 9.8  | Java implementation of histograms 345   |
|   | 9.9  | Smalltalk implementation of congruential random number generators 363                         |
|   | 9.10 | Smalltalk implementation of an additive sequence random number generator 364                  |
|   | 9.11 | Smalltalk implementation of random number generators 366                                      |
|   | 9.12 | Java implementation of an additive sequence random number generator 367                       |
|   | 9.13 | Smalltalk implementation of a probability distribution 372                                    |
|   | 9.14 | Smalltalk implementation of a probability distribution with unknown distribution function 375 |
|   | 9.15 | Smalltalk implementation of a probability distribution function 376                           |
|   | 9.16 | Java implementation of a probability distribution 377   |

### xx Code Listings

|    | 9.17  | Java implementation of a probability distribution with unknown distribution 382 |
|----|-------|---|
|    | 9.18  | Java implementation of a probability distribution function 383                  |
|    | 9.19  | Smalltalk implementation of the normal distribution 384                         |
|    | 9.20  | Java implementation of the normal distribution 387                              |
|    | 9.21  | Smalltalk implementation of the gamma distribution 394                          |
|    | 9.22  | Java implementation of the gamma distribution 397                               |
|    | 9.23  | Smalltalk implementation of an experimental distribution 404                    |
|    | 9.24  | Java implementation of an experimental distribution 406                         |
| 10 | 10.1  | Smalltalk implementation of the Fisher-Snedecor distribution 416                |
| 10 | 10.1  | Smalltalk implementation of the F-test 418                                      |
|    | 10.2  | Java implementation of the Fisher-Snedecor distribution 420                     |
|    | 10.4  | Smalltalk implementation of the Student distribution 427                        |
|    | 10.5  | Smalltalk implementation of the <i>t</i> -test 430                              |
|    | 10.6  | Java implementation of the Student distribution 432                             |
|    | 10.7  | Smalltalk implementation of the $\chi^2$ distribution 439                       |
|    | 10.8  | Java implementation of the $\chi^2$ distribution 440                            |
|    | 10.9  | Smalltalk implementation of the weighted point class 444                        |
|    | 10.10 | Java implementation of the weighted-point class 446                             |
|    | 10.11 | Smalltalk implementation of a scaled probability density function 450           |
|    | 10.12 | Smalltalk implementation of $\chi^2$ -test on histograms 452                    |
|    | 10.13 | Java implementation of a scaled probability density function 454                |
|    | 10.14 | Smalltalk implementation of linear regression 463                               |
|    | 10.15 | Java implementation of linear regression 467                                    |
|    | 10.16 | Smalltalk implementation of a polynomial least-square fit 475                   |
|    | 10.17 | Smalltalk implementation of a polynomial with error 477                         |
|    | 10.18 | Java implementation of a polynomial least square fit 479                        |
|    | 10.19 | Java implementation of a polynomial with error 481                              |
|    | 10.20 | Smalltalk implementation of a nonlinear least-square fit 486                    |
|    | 10.21 | Java parametrized function interface 490  |
|    | 10.22 | Java implementation of a nonlinear least-square fit 493                         |
|    | 10.23 | Smalltalk implementation of a maximum-likelihood fit 503                        |
|    | 10.24 | Java implementation of a maximum-likelihood fit 506                             |
| 11 | 11.1  | Smalltalk classes common to all optimizing classes 518                          |
|    | 11.2  | Smalltalk abstract class for all optimizing classes 520                         |
|    | 11.3  | Smalltalk projected function classes 522  |
|    |       |   |

Code Listings xxi

| 11.4  | Java optimizing point classes 524  |     |
|-------|--|-----|
| 11.5  | Java optimizing vector classes 527   |     |
| 11.6  | Java optimizing point factory classes 532  |     |
| 11.7  | Java abstract class for all optimizing classes 534   |     |
| 11.8  | Java projected function class 537  |     |
| 11.9  | Smalltalk golden section optimum finder 541  |     |
| 11.10 | Java implementation of the golden section optimum search   | 544 |
| 11.11 | Smalltalk optimum bracket finder 547   |     |
| 11.12 | Java optimum bracket finder 548  |     |
| 11.13 | Smalltalk implementation of Powell's algorithm 552   |     |
| 11.14 | Java implementation of Powell's algorithm 555  |     |
| 11.15 | Smalltalk implementation of simplex algorithm 560  |     |
| 11.16 | Java implementation of simplex algorithm 563   |     |
| 11.17 | Smalltalk chromosome: abstract and concrete 573  |     |
| 11.18 | Smalltalk implementation of genetic algorithm 576  |     |
| 11.19 | Java abstract implementation of a chromosome 579   |     |
| 11.20 | Java implementation of genetic algorithm 582   |     |
| 11.21 | Java implementation of a vector chromosome 585   |     |
| 11.22 | Java implementation of genetic algorithm for vectors 589   |     |
| 11.23 | Smalltalk implementation of a general optimizer 593  |     |
| 11.24 | Java implementation of a general optimizer 595   |     |
|       |  |     |
| 12.1  | Constitution of the consti |     |
| 12.1  | Smalltalk abstract data server 602   |     |
| 12.2  | Smalltalk memory-based data server 602   |     |
| 12.3  | Java abstract data server 603  |     |
| 12.4  | Java memory-based data server 604  |     |
| 12.5  | Smalltalk implementation of vector average 609   |     |
| 12.6  | Smalltalk implementation of covariance matrix 610  |     |
| 12.7  | Java implementation of vector average 611  |     |
| 12.8  | Java implementation of covariance matrix 613   |     |
| 12.9  | Smalltalk Mahalanobis center 621   |     |
| 12.10 | Java Mahalanobis center 623  |     |
| 12.11 | Smalltalk K-cluster algorithm 630  |     |
| 12.12 | Smalltalk implementation of a Euclidean cluster 633  |     |
| 12.13 | Java K-cluster algorithm 635   |     |
| 12.14 | Java implementation of a Euclidean cluster 641   |     |
| 12.15 | Smalltalk covariance cluster 643   |     |
| 12.16 | Iava covariance cluster 644  |     |

Code Listings xxii A.1 Smalltalk code simulating decimal floating-number arithmetic 648 C.1 Inheritance of private methods 664 D D.1 Smalltalk implementation of the beta distribution 671 D.2 Java implementation of the beta distribution 675 D.3 Smalltalk implementation of the Cauchy distribution 681 D.4 Java implementation of the Cauchy distribution 684 D.5 Smalltalk implementation of the exponential distribution 689 D.6 Java implementation of the exponential distribution 691 D.7 Smalltalk implementation of the Fisher-Tippett distribution D.8 Java implementation of the Fisher-Tippett distribution 698 D.9 Smalltalk implementation of the Laplace distribution 704 D.10 Java implementation of the Laplace distribution 705 D.11 Smalltalk implementation of the log normal distribution 710 D.12 Java implementation of the log normal distribution 713 D.13 Smalltalk implementation of the triangular distribution 716 D.14 Java implementation of the triangular distribution 720 D.15 Smalltalk implementation of the uniform distribution 723

Java implementation of the uniform distribution 725

Java implementation of the Weibull distribution 732

Smalltalk implementation of the Weibull distribution 730

D.16

D.17

D.18

Si je savais une chose utile à ma nation qui fût ruineuse à une autre, je ne la proposerais pas à mon prince, parce que je suis homme avant d'être Français, parce que je suis nécessairement homme, et que je ne suis Français que par hasard.<sup>1</sup>

-Charles de Montesquieux

When I first encountered object-oriented programming I immediately became highly enthusiastic about it, mainly because of my mathematical inclination. After all, I learned to use computers as a high-energy physicist. In mathematics, a new, high order concept is always based on previously defined, simpler concepts. Once a property is demonstrated for a given concept, it can be applied to any new concept sharing the same premises as the original one. In object-oriented language, this is called *reuse* and *inheritance*. Thus, numerical algorithms using mathematical concepts that can be mapped directly into objects.

This book is intended for object-oriented programmers who need to implement numerical methods in their applications. The algorithms exposed here are mostly fundamental numerical algorithms with a few advanced ones. The purpose of the book is to show that implementing these algorithms in an object-oriented language is feasible—and quite easily feasible. I expect readers to be able to implement their own favorite numerical algorithm after seeing the examples discussed in this book.

The scope of the book is limited. It is not a Bible about numerical algorithms. Such Bible-like books already exist and are quoted throughout the chapters. Instead, I wanted to illustrate mapping between mathematical concepts and computer objects. I have limited the book to algorithms, which I have implemented and used in real applications over 12 years of object-oriented programming. Thus, the reader can be certain that the algorithms have been tested in the field.

Because the book's intent is to show numerical methods to object-oriented programmers, the code presented here is described in depth. Each algorithm is presented with the same organization. First the necessary equations are introduced with short

<sup>1.</sup> If I knew some trade useful to my country but that would ruin another, I would not disclose it to my ruler, because I am a man before being French, because I belong to mankind while I am French only by a twist of fate.

explanations. This book is not about mathematics, so explanations are kept to a minimum. Then the general object-oriented architecture of the algorithm is presented. Finally, because this book is intended to be a practical one, the code implementation is exposed. First, I describe how to use it, for readers who are just interested in using the algorithm, and then I discuss and present the code implementation.

The question was which language to use?

I decided to select two languages: Smalltalk and Java. Java is an obvious choice today since the world seems to lean toward Java. In spite of all the current emphasis on Java, I personally prefer Smalltalk for any practical use. But, as the computer industry evolves, and because I am anything but a language fanatic, the reader must be aware that this last statement may no longer be true by the time these lines are read. New computer languages will certainly combine object-oriented features with novel concepts, and I am ready to try any serious new contender.

Having stated my preference for Smalltalk does not mean that I don't like Java. Java has brought forth interesting innovations and certainly paved a golden way for object-oriented programming. I personally have gained a lot of insight in learning Java.

The code is this book has been written in both languages and is presented in separate sections. My hope is that Smalltalk and Java programmers will be exposed to the other language by reading this book. If they keep an open mind and do indeed read both code sections, they certainly will gain something from the comparison as I did myself in writing them.

As far as possible, each algorithm is presented with examples of use. I did not want to build contrived examples and instead have used examples personally encountered in my professional life. Some people may think that some examples are coming from esoteric domains. This is not so. Each example has been selected for its generality. The reader should study each example regardless of the field of application and concentrate on the universal aspects of it.

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