

AUTOMATED FORECASTING OF TIME SERIES USING COMPUTATIONAL INTELLIGENT APPROACH

**DR. ASHWINI N
DR. V NAGAVENI**



Automated Forecasting of Time Series Using Computational Intelligent Approach

First Edition

Authors

Dr. Ashwini N
Dr. V Nagaveni



Iterative International Publishers

Title of the Book: Automated Forecasting of Time Series Using
Computational Intelligent Approach

First Edition: 2023

Copyright 2023 © Authors

Dr. Ashwini N, Assistant Professor, BMS Institute of Technology and management, Doddaballapur main Road Avalahalli, Yelahanka Bengaluru.

Dr. V Nagaveni, Professor, Department of CSE at Acharya Institute of Technology, Soladevanahalliu, Acharya Dr. Sarvapalli Radhakrishnab Road Hesaraghatta Main Road Bengaluru.

No part of this book may be reproduced or transmitted in any form by any means, electronic or mechanical, including photocopy, recording or any information storage and retrieval system, without permission in writing from the copyright owners.

Disclaimer

The authors are solely responsible for the contents published in this book. The publisher don't take any responsibility for the same in any manner. Errors, if any, are purely unintentional and readers are requested to communicate such errors to the editors or publishers to avoid discrepancies in future.

E-ISBN: 978-93-5747-073-5

MRP: 180/-

Publisher, Printed At & Distribution By:

Selfypage Developers Pvt Ltd.,
Pushpagiri Complex,
Beside Sbi Housing Board,
K.M. Road Chikkamagaluru, Karnataka.
Tel.: +91-8861518868
E-Mail:Info@liponline.Org

Imprint: I I P Iterative International Publishers

Abstract

Making predictions is called extrapolation in the classical statistical handling of time series data. Forecasting involves taking models to fit historical data and using them to predict future observations. Successful research in automated forecasting incorporates advances in data science, computer science, applied mathematics or a related field. The approach involves years of experience, building Time Series Forecasting (TSF) models, expertise in data collection, cleaning, preprocessing, and wrangling. The objective of the current dissertation is to evolve a novel algorithm for automated forecasting of time series using a computational intelligence approach.

Work started with a literature survey throughout the available relevant research work to identify opportunities for leveraging published data to drive possible identification of problems area and solutions. Mine and analyze available data from data sources to drive optimization and improvement of development and implement strategies. Assess the effectiveness and accuracy of new data sources and data gathering techniques. Develop custom data models and algorithms as needed and appropriate to address identified problems. Use predictive modeling and time series forecasting to increase and optimize targeted outcomes. Develop testing mechanisms and test model quality and value, validate hypothesis accordingly and publish the result. Current work involves the implementation of multiple case studies.

The first case study is related to a survey on the forecaster model using time series data. This work describes the brief introduction to the forecaster model using time series data and the outcome of the current survey. The ability to forecast the future is on only past data, which leads to strategic advantages and will be the key to success in organizations. TSF allows the modeling of complex systems in several research areas. There are verity of methods for time series data, which mainly depends on whether the data is linear or non-linear. This survey concentrated on neural network, evolutionary computation.

Further work is on computational intelligence-based Chaotic TSF prediction using Evolved Neural Network (ENN) and its outcome. A non-linear behavior existing intrinsically with a deterministic dynamic system showing high sensitivity with initial condition is chaotic behavior. A time-delay neural network is applied to predict the various chaotic time series by selecting optimal set of weights using adaptive social behavior optimization. Comparison of learning performance has given with popularly gradient-descent based learning. Performance evaluation is the coefficient of determination with root-mean-

square (RMS) error in prediction under the learning and test phase of chaotic time series. Three benchmarks of chaotic time series (Logistic differential equation, Micky-glass and Lorenz system) are used for predicting. Experimental results show that the proposed new method of ENN learning is very efficient and has delivered a better prediction for various chaotic time series.

Further the research is continued with forecasting the trend-cycle of TSF using a hybrid model of Linear Regression (LR) & Adaptive RBF Neural Network (ARBFNN). An individual neural model generally performs well over mapping function-based forecasting, but the complexity arises when there is a mixture of a different pattern in time series data and the need to predict the distant time samples arises. The current work resolves the complexity of forecasting the trend-cycle in time series data by using decomposition approach of time series data into fundamental data patterns of trend and cyclic. A hybrid model is developed combining linear regression model and adaptive radial basis function neural network for predicting the trend patterns and cyclic pattern respectively. The Gaussian function is used as a basic function for its efficient applicability in spreading the centre of function's control with weights values, thus improving the learning performance. Performances compared against a static version of radial basis function neural network and multilayer perceptron-based model with a mapping-based forecast of power demand by a house and monthly basis year-wise power generation prediction.

The adaptive radial basis functions neural network has appeared as a better predictor model for function mapping-based forecasting to others. In trend-cyclic time-series, the adaptive radial basis function neural network has shown excellent performance over training data while poor performances occurred over the test data. The proposed decomposition approach has given significant improvement in predicting the time series having trend-cycle patterns.

The last case study is on parameter estimation of linear & non-linear multiple regression models using Differential Evolution (DE). Forecasting the regression model has been considered widely because of its satisfactory performances with simplicity in the design. Regression model-based prediction quality heavily decided by the involved coefficient parameters. Even though for the linear model, up to the high accuracy, the algebraic method-based approach provides the optimal solution but the difficulties appeared when there is higher-order complexity involved among the independent parameters. This work has proposed the use of natural computation based computational intelligence approach. Primarily to explore the solution domain for obtaining the optimal values of parameters. The different forms of computing paradigm like DE and swarm intelligence are there over parameter estimation for non-linear and linear

regression models for applications. The performance evolution has been examined and compared with the index quality coefficient of determination. With extensive experimental work, DE based estimation has delivered the optimal coefficient values.

To summarize, forecasting methods analyzed for all the case studies mentioned above. This analysis involves prior periods to expose improvement opportunities in areas such as increases, parameter changes (historical versus current), fluctuation impacts and exposures, rationalizations, parameter alignments, etc. The statistical requirements associated with the case studies like regression type can be beneficial. The operating statistics, variance analysis forecasts, and key ratios were some of the parameters. Experiment with an ad hoc analysis and variance data, making extensive use of MATLAB tools. The objective was to strive for the continuous improvement, development, modification, and implementation of models, as necessary. In most case studies, analyzing large amounts of data to summarize it into meaningful and relevant information. This approach led to improving the efficiency of the models in providing insightful, timely, and accurate process improvements with quantifiable results to measure effectiveness. The overall objective of the dissertation accomplished.

Acknowledgements

I am very much grateful to our Hon'ble Vice-Chancellor Dr. Karisiddappa, Dr. A.S Deshpande, Registrar, Dr. B.E Rangaswamy, Registrar (Evaluation), M.A Sapna, Finance Officer, Visvesvaraya Technological University, Jnana Sangama, Machhe, Belgaum, Karnataka, India for the permission and facilities provided for completing this work.

I would also like to thank former Principal Dr. Prakash M R, Acharya Institute of Technology, Bengaluru, for motivating me in all possible ways.

It is a great pleasure to express my deep sense of gratitude and profound thanks to my research supervisor and guide Dr. Nagaveni V, Professor, Department of Computer Science and Engineering, Acharya Institute of Technology, Bengaluru. Her inspiration, continuous care, able guidance, and personal support have embellished the success of this research pursuit.

I am extremely thankful to, Dr. Nandini N, Associate Professor, Department of Computer Science and Engineering, Dr. Ambedkar Institute of Technology, Bengaluru and Dr. Ravikumar G K, Professor and Research Head (Computer Science & Engg) at BGSIT- Adichunchanagiri University, Doctoral Committee Members, for their valuable suggestions throughout my research period.

I would like to express my sincere thanks to Dr. Prashanth C M, Research Centre Head, Department of Computer Science and Engineering, Acharya Institute of Technology, Bengaluru, with a profound sense of gratitude for having permitted me to do the research work in the Department of Computer Science and Engineering. His unbounded encouragement and valuable suggestions were instrumental in completing this work successfully.

I want to salute "BMS Institute of Technology and Management, Bengaluru" and express my gratitude to the members of Management, BMS Trust, for their generous thinking towards encouraging the faculty to pursue higher degrees.

I also want to thank our Principal, BMS Institute of Technology and Management, Bengaluru for his continuous support.

Finally, I would like to express my heartfelt gratitude to my parents, family members, friends, and colleagues for their encouragement and help, who are the reason behind the successful completion of my work, and I treasure them for my future endeavors.

Dr. Ashwini .N

Contents

Sl. No.	Descriptions	Page No.
Chapter -1	Introduction	1-20
1.1.	Computational Intelligence	1
1.2.	Automated forecasting	2
1.3.	Time Series	5
1.3.1.	Prediction Steps	6
1.3.2.	Prediction Models	7
1.3.3.	Chaotic system	10
1.3.4.	Forecaster Models	11
1.3.5.	Generalized Forecaster Model	12
1.3.6.	Comparative Analysis Approach	14
1.4.	Motivation	17
1.5.	Problem Definition	18
1.6.	Objective of the Work	19
1.7.	Thesis Organization	19
Chapter -2	Literature Survey	21-25
Chapter -3	Methods and Tools	26-33
3.1.	Matlab	26
3.2.	Time Delay Neural Network (TDNN)	27
3.3.	Adaptive social behavior optimization (ASBO)	29
3.4.	Adaptive Radial Basis Function (ARBF)	30
3.5.	Multiple-layer Perceptron Neural Network (MLPNN)	32
Chapter -4	Chapter 4: Study on Forecaster Model Using Time Series Data	33-40
4.1.	Forecasting Methods	34
4.2.	Forecasting Models Applications	37
4.3.	Reference Model	39
4.4.	Summary	40
Chapter -5	Computational Intelligence Based Chaotic TSF Prediction Using ENN	41-62
5.1.	Overview	41
5.2.	Methodology	41
5.3.	Time Series Prediction and Dynamical Systems	42
5.4.	Proposed ASBO based learning	43
5.5.	Chaotic Time Series	45
5.6.	Experimental Setup	46
5.7.	Results and Discussions	48

5.7.1. Case 1: Logistic Difference Equation Chaotic Time Series	48
5.7.2. Case 2: Mackey-Glass Chaotic Time Series	52
5.7.4. Case 3: Lorenz System Chaotic Time Series	55
5.7.5. LOR Delta Learning	58
5.8. Summary	62
Chapter -6 Forecasting of Trend-Cycle TSF Using A Hybrid Model of LR & ARBFNN	63-77
6.1. Overview	63
6.2. Hybrid model of Linear regression and Adaptive RBF	63
6.3. Experimental Result	65
6.3.1. Performance Analysis Method	65
6.3.2. Mapping based forecasting	66
6.3.3. Proposed Hybrid Model for Trend- Cycle TS Data Forecasting	72
6.4. Summary and Outlook	77
Chapter -7 Parameter Estimation of Linear & Non- Linear Multiple Regression Model Using Differential Evolution	78-98
7.1. Overview	78
7.2. Proposed Model	79
7.3. Experimental Setup	81
7.3.1. Nonlinear model	82
7.3.2. Multiple Regression	83
7.4. Results and Discussions	83
7.4.1. Nonlinear Model	83
7.4.2. Nonlinear Model 2	86
7.4.3. Multiple Regression Model 3	88
7.4.4. Multiple Regression Model 4	92
7.5. Comparison of Result	97
7.6. Summary	98
Chapter -8 Conclusion	99-100
Chapter -9 Future Scope	101-102
Chapter -10 List of Acronyms	103
Chapter- 11 Notations	104
References	
List of Publications	

ABOUT AUTHORS



Dr. ASHWINI N

U.G-ISE at The oxford college of Engineering in 2004

PG-CSE at AMC college of Engineering in 2007

She Started working as a Lecturer in TOCE for 8 years and now working at prestigious College as Assistant Professor in BMS Institute of Technology and Management from 2012 for almost 8 Years. She has almost 7 years of research experience in Data Analytics and completed Ph.D under Visvesvaraya Technological University. She has almost 6 papers in peer-reviewed journals and 2-Scopus paper in springer and 1-SCI Indexing. She has published a patent on 'Alert System for the derailment of railway tracks' at Indian patent office. She has some funded projects from KSCST for her final year student projects and won "Best project award" from ISE discipline from KSCST for the year 2016-2017. She has been 'Wipro Certified Faculty' in Core Java Programming and training students of BMSIT for their certification every year for placement at Wipro. She has been as a recourse person in FDPs/ open courses for students/ faculty in areas like ML, RPA, ARM Controller, on Few Simulation tools. She has done many MooC courses like few are programming in RPA, Python, Cloud services, IoT Settings, Big Data, Leadership and emotional Intelligence in coursera and nptel.



Dr.V NAGAVENI

Has total teaching experience of 21 years in various institutions, worked as a Professor in the department of CSE at Acharya Institute of Technology from past 15 years, taking a leading role as Internal Complaint committee chairman, CSE Department PG,R and D coordinator, Internship coordinator, Assistant dean for Student welfare, working towards completion of SPICES grant sanctioned by AICTE for student club activities, NBA and NAAC coordinator for various criteria's, Reviewer for various IEEE and Springer conferences as well as many Scopus indexed journals.



E-ISBN: 978-93-5747-073-5



MRP Rs.180/-