

EDITED BY BRUNO S. SERGI  
AVIRAL KUMAR TIWARI  
SAMIA NASREEN

ENTREPRENEURSHIP  
AND GLOBAL  
ECONOMIC GROWTH

MODELING  
ECONOMIC  
GROWTH IN  
CONTEMPORARY  
INDIA

# **Modeling Economic Growth in Contemporary India**

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# Modeling Economic Growth in Contemporary India

EDITED BY

**BRUNO S. SERGI**

*University of Messina, Italy; Harvard University, USA*

**AVIRAL KUMAR TIWARI**

*Indian Institute of Management Bodh Gaya (IIM Bodh Gaya)  
Uruvela, India*

AND

**SAMIA NASREEN**

*Lahore College for Women University, Pakistan*



United Kingdom – North America – Japan – India – Malaysia – China

Emerald Publishing Limited  
Emerald Publishing, Floor 5, Northspring, 21-23 Wellington Street, Leeds LS1 4DL

First edition 2024

Editorial matter and selection © 2024 Bruno S. Sergi, Aviral Kumar Tiwari and Samia Nasreen.  
Individual chapters © 2024 The authors.  
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**British Library Cataloguing in Publication Data**

A catalogue record for this book is available from the British Library

ISBN: 978-1-80382-752-0 (Print)

ISBN: 978-1-80382-751-3 (Online)

ISBN: 978-1-80382-753-7 (Epub)



INVESTOR IN PEOPLE

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## About the Editors

**Bruno S. Sergi** is an Instructor at Harvard University, where he teaches courses on development economics and the economics of emerging markets. At Harvard, he is also a Faculty Affiliate at the Harvard Center for International Development and an Associate at the Asia Centre. He is codirector of the Lab for Entrepreneurship and Development (LEAD), a research lab based in Cambridge, USA. LEAD aims to generate and share knowledge about entrepreneurship, development, and sustainability.

**Dr Aviral Kumar Tiwari** is an Associate Professor of Economics at the Indian Institute of Management Bodh Gaya (IIMBG) in the Department of Economics and Business Environment. Prof Tiwari is a C-EENRG Fellow at the Department of Land Economy, University of Cambridge and Research Fellows, University of Economics Ho Chi Minh City, Vietnam. Before joining IIMBG, he worked as an Associate Professor at Rajagiri Business School (RBS), India, and Montpellier Business School (MBS), Montpellier, France, from where he received his post-doc. After graduating with a degree in Economics from Lucknow University, Lucknow, India, he received his MPhil (in Labour Economics) and PhD (in Energy and Environment) from ICFAI University Tripura. He is basically an Applied Economist with broad empirical interests focusing on, but not limited to, emerging economies, particularly Asia. His research interests focus on various issues concerning energy, environment, tourism, macroeconomy and growth and development, etc. He has published widely in peer-reviewed international journals and contributed more than 100 ABDC-A & A\* research papers so far. He is the only economist from India in the career ranking of the world's top 2% scientists list of 2021, 2022, 2023 and 2024 published by Stanford University Study. He is ranked in first position in India as a researcher by IDEAS. He is one of the Highly Cited Researchers 2020, 2022 and 2023 by Clarivate™ of Web of Science™. He is one of the recipients of M J Manohar Rao Award (for young econometrician) for 2014 from The Indian Econometric Society, 2015. He is a life member of the Indian Economic Association, India, and a member of several other international associations such as the International Association for Energy Economics (IAEE), USA, Association for Comparative Economic Studies, USA, Western Economic Association International, USA, etc. He holds different editorial positions at more than 10 journals of international repute (ABDC, Scopus and ABS-indexed journals).

**Samia Nasreen** is an Associate Professor in the Department of Economics at Lahore College for Women University, Lahore, Pakistan. Her primary research interests are in development economics, energy economics, environmental economics, and financial economics.

## About the Contributors

**Bhavya Advani** is a Research Scholar pursuing her PhD in the department of Humanities and Social Sciences at Maulana Azad National Institute of Technology, Bhopal, India. Her current areas of research are environmental economics and economics of happiness. She has delivered research paper presentations in conferences at Gokhale Institute, Maharashtra and at Rajagiri Business School, Kerala. She has qualified 2021 UGC NET JRF and has completed her Master's in Economics from the Institute for Excellence in Higher Education in the year 2021. She has a corporate working experience of 2 years.

**Shilpa Ahuja** is a PhD Research Scholar at the Department of Economics, Indian Institute of Technology, Bombay. Prior to this, she was working as an Assistant Professor in the Department of Business Economics, Sri Guru Gobind Singh College of Commerce, University of Delhi. She has taught subjects like International Economics, International Finance and Investment Analysis and Portfolio Management to undergraduate students. She has a keen interest in the area of international capital flow movements, monetary policy, and financial markets. She has completed her postgraduation from Delhi School of Economics, University of Delhi.

**Namrata Barik**, a PhD Scholar at IIT Bombay, specializes in Energy Economics. Her research focuses on the economic aspects of renewable energy adoption.

**Anusuya Biswas** is an Associate Professor at Alliance University, Bangalore. She holds a PhD degree in Economics from Amity University Uttar Pradesh. She has qualified UGC-NET exam in Economics. Dr Anusuya has an experience of over 11 years as an academician, researcher, and administrator. Her research interest entails Applied Econometrics, International Trade, Timeseries Forecasting, Prescriptive and Predictive Analysis, Macroeconomic Analysis, and Environmental Sustainability. As a researcher, she has presented her papers in more than 30 conferences and published above 10 research papers in various peer-reviewed international and national journals including SCOPUS, Web of Science, and one paper accepted in ABDC. She also published six book chapters in reputed journals.

**Sukhmani Bhatia Chugh** is an Assistant Manager at Canara Bank, Chandigarh. She has done her MBA in Finance from Punjab Agriculture University, Ludhiana. She also has done various certifications from IIBF including JAIIB and

CAIIB. She has about 12 years of corporate experience in banking, project finance, and sales and marketing in various organizations. Her areas of interest in research include Mergers and Acquisitions, Economic policy, strategy etc. She has attended international and national conferences and presented her work there. She is pursuing her PHD in Management from Chitkara Business School, Chitkara University.

**Varsha Singh Dadia** is currently a Senior Research Scholar at the Department of Humanities and Social Sciences, Indian Institute of Technology Roorkee, Roorkee, India. She completed her Bachelor in Economics (Honors) from the University of Delhi. She received her Master of Economics from the Central University of Haryana, Haryana, India. She qualified National Eligibility Test (NET-JRF) for Lectureship and Junior Research Fellowship conducted by the University Grant Commission-UGC, New Delhi, India. Her research interests include efficiency and productivity analysis and the thermal power sector. She has also presented several papers at National and International conferences.

**Ruchika Dawar**, with a strong academic background, PhD from HNB Garhwal University (A Central University) and MBA from IMS, Dehradun. Having experience of more than 24 years with 7 years in the corporate sector that is in sales and marketing and 17 years in teaching. Currently associated with the National Institute of Fashion Technology (NIFT), Jodhpur since 2012. Published and presented many papers, posters, and case studies at reputed national and international platforms. With vast experience in industry and academics also involved in various projects at NIFT and giving a sincere effort to bring the Department of Fashion Management Studies (FMS) at its best expertise includes entrepreneurship management, consumer buying behavior, organizational behavior, marketing management, professional practices, etc.

**Shilpa Deo** is currently working as an Assistant Professor in the School of Humanities and Social Sciences at DES Pune University, India. Dr Deo has completed her doctoral degree (PhD) from the premier and India's top-ranked institutes in economics – Gokhale Institute of Politics and Economics, Pune, India. Her teaching and research interests have been in development economics, micro and macroeconomics, research methods, and international business. She has won the “Best Research Paper Award” for a paper presentation at two international conferences. She has been a reviewer and editorial board member for reputed journals. Currently, she serves as a Research Fellow at the Center for International Trade and Business in Asia, James Cook University, Australia.

**Narayanage Jayantha Dewasiri** is a Professor attached to the Department of Accountancy and Finance, Sabaragamuwa University of Sri Lanka. Further, he currently serves as the Brand Ambassador at Emerald Publishing, UK, and the Vice President of the Sri Lanka Institute of Marketing. He is a pioneer in applying triangulation research approaches in the management discipline. He is currently serving as the Co-Editors-in-Chief of the *South Asian Journal of Marketing* published by Emerald Publishing, Managing Editor of the *Asian Journal of*

*Finance*, and *South Asian Journal of Tourism and Hospitality*, published by the Faculty of Management Studies, Sabaragamuwa University of Sri Lanka.

**Ekta Duggal**, MCom, MPhil, PhD, is working as a Professor, Department of Commerce, Motilal Nehru College, University of Delhi. She has done her doctorate in marketing from FMS, University of Delhi. Her areas of teaching and research include business organization and management, e-commerce, services marketing, and retail quality. She has taught courses in master's programmes at Department of Commerce, Delhi School of Economics, and Guru Gobind Singh College of Commerce, University of Delhi. She has also participated in numerous conventions and seminars. She has published 28 research papers in various journals of repute including *International Journal of Business Ethics in Developing Economies*, *Journal of Marketing and Business Communication*, and *South Asian Journal of Global Business Research*. She participated in the third Academy of Indian Marketing–American Marketing Association Sheth Foundation Doctoral Consortium as the Consortium Fellow at Dubai.

**Thilini Chaturika Gamage** is a Professor attached to the Department of Marketing Management, Sabaragamuwa University of Sri Lanka. Her research interests center on Digital Marketing, Technology Management, Tourism and Hospitality Marketing, and Entrepreneurship. Her research works were published in top-tier management and marketing journals, including the *Journal of Strategic Marketing*, the *Journal of Product and Brand Management*, *Tourism Management*, and the *International Journal of Hospitality Management*. Further, she is an Editor of the *South Asian Journal of Marketing*, published by the Sri Lanka Institute of Marketing in collaboration with Emerald Publishing.

**Athula Gnanapala** is a well-respected expert in Tourism Management and currently serves as a Professor at the Sabaragamuwa University of Sri Lanka. He is also the Dean of the Faculty of Management Studies at SUSL. Prof Gnanapala is the Co-editor-in-chief of the *South Asian Journal of Tourism and Hospitality* and has an impressive research record with over 50 articles published in indexed and refereed journals, 25 books, and book chapters and has presented at more than 70 international conferences. He serves as a consultant, reviewer, editorial member, and scientific committee member for nationally and internationally recognized academic journals.

**Archana Goel** is an Assistant Professor at Chitkara Business School. She has done MCom, BEd, and PhD and has 12 years of corporate and academic experience. Her PhD is in corporate governance. Her research areas include corporate governance, mergers and acquisitions, financial reporting, ESG, etc. She specializes in teaching accounts, statistics, research methodology, and finance courses. She has around 25 papers published in national and international journals of repute and has attended many national and international conferences. Several patents have been granted to her. Currently, she is guiding two PhD scholars as well.

**Bhumika Goswami**, a dedicated student currently pursuing a Master's in Economics at Riga Technical University. With a strong foundation in the field, Bhumika completed her BSc Hons in Economics from MIT WPU. Alongside her academic pursuits, Bhumika has developed a keen interest in the fascinating realms of neuroeconomics, behavioral science, and neuromarketing. This unique blend of disciplines allows her to explore the intricate connections between economics and the human mind, unraveling the complexities of decision-making and consumer behavior. Bhumika's passion for understanding the interplay between economics and psychology highlights her drive to uncover new insights and bridge the gap between theory and practice. With her enthusiasm and dedication, Bhumika is poised to make meaningful contributions to the field.

**Rachita Gulati** is an Associate Professor of Economics at the Department of Humanities and Social Sciences, Indian Institute of Technology (IIT), Roorkee, Uttarakhand. She received the Subir Chowdhury Visiting Fellowship 2017–2018 from the India Observatory, London School of Economics and Political Sciences, London, UK. Her teaching and research interests relate to applied econometrics, banking efficiency, financial stability, corporate governance, and efficiency and productivity analysis. She has published over two dozen articles in top-ranked journals, including *Omega*, *Quarterly Review of Finance and Economics*, *Economic Modelling*, and *The North American Journal of Finance and Accounting*, among others. She has worked on project studies awarded/sponsored by the Reserve Bank of India, the State Finance Commission of Haryana, the Ministry of Tribal Affairs, and ICSSR (IMPRESS Scheme). She is also a member of several national and international associations, including the International Society of Efficiency and Productivity Analysis, the Indian Econometric Society, the International Corporate Governance Society, the International Econometric Society, etc.

**Kokila K** is a research scholar in Finance at VIT Business School, Chennai. Prior to this, she completed her MBA in finance and marketing. She has work experience in the stock market and commodities market trading. Her area of interest is financial market, stock market anomalies, investor sentiments, and macroeconomic variables.

**Anuja Kure**, currently a Financial Analyst at Wipro, possesses a deep-seated passion for both economics and finance. With an academic background that includes graduating with honors in Economics from Dr Vishwanath Karad MIT-WPU, Pune, India, she skillfully applies her analytical prowess to navigate the financial landscape. Apart from her academic and professional role, she is deeply committed to giving back to the society. This commitment is evident in her involvement with S.H.E, a social enterprise dedicated to empowering women artists in rural Kerala. Through this initiative, she has not only explored the mental health needs of rural women but has also demonstrated her leadership and persuasive communication skills by securing seed funding for the cause through a compelling presentation at Dunin Deshpande Queen's Innovation Center (DDQIC).

**Bhajan Lal** holds the position of Assistant Professor within the domain of Human Resource Management at the Institute of Management, Nirma University, located in Ahmedabad, Gujarat, India. He has successfully attained his doctoral credentials from the esteemed Indian Institute of Technology, Roorkee, focusing on Human Capital Creation. Accumulating over a span of 9 years, Dr Lal has garnered a wealth of expertise in the realms of pedagogy, scholarly inquiry, and professional advisement. His scholarly pursuits primarily revolve around the spheres of HR analytics, performance assessment, measurement methodologies, and the intricate realm of human capital generation.

**J. Divya Merry Malar** is an Assistant Professor in the Department of Commerce at Holy Cross College (Autonomous) in Nagercoil, Tamilnadu, India. Affiliated with Manonmaniam Sundaranar University, Tirunelveli. With a wealth of knowledge and experience in the field of Commerce, Dr Malar is dedicated to imparting valuable insights to her students and contributing to the academic community. Dr Malar holds a PhD in Commerce and has a profound interest in accounting and commerce.

**Priya Mandleshwar** is a Doctoral Scholar in the area of Finance and Accounting at the Indian Institute of Management Indore. Her research interests cover Corporate Social Responsibility (CSR), corporate finance, mergers and acquisitions, and corporate governance. Along with that, she is working on papers in the area of institutional investors. Prior to her doctoral studies, she completed MCom with a finance specialization at Banaras Hindu University. Her academic prowess earned her a gold medal during her undergraduate studies at Guru Ghasidas Central University. Passionate about unraveling the link between responsible business practices, Priya aspires to contribute significant insights into the realm of ethical corporate frameworks.

**Srishti Nagarajan** is an MPhil Scholar, Department of Commerce, Delhi School of Economics, University of Delhi. She has done her Master's (MCom) from Ramjas College, University of Delhi, India. She has presented papers in International Conferences. She has won the best paper award for presentation of a paper in the 10th International Conference on Business and Management organized by the Department of Commerce, Shaheed Bhagat Singh College, University of Delhi. She has published a chapter in an edited book titled *Paradigm Shift in Marketing and Finance* by Bharti Publications. Her research interest includes areas such as international business and financial management.

**Prof Puja Padhi** is a distinguished academic professional renowned for her expertise in Economics. She holds a PhD from the Central University of Hyderabad. She has significantly contributed to the field, particularly in financial economics, applied econometrics, and macroeconomics. Since 2008, she has been an integral faculty member at the Department of Economics, IIT Bombay, where her impactful research and multidisciplinary approach have influenced the academic discourse.

**Anuradha S Pai** is currently working as an Assistant Professor at the Department of Economics, PES University, Bangalore. She is pursuing PhD in the area of Organ Donation. Her areas of interest include Law and Economics and Development Economics. She has one book chapter and two articles to her credit. She has won Best Paper Award at an International Conference. She has completed a certificate program from Gokhale Institute for Politics and Economics on Computer Applications in Economics. She teaches papers like law and economics and tries to deliver through innovative teaching learning pedagogies.

**Pratham Parekh** has completed a PhD from the Center for Studies in Society and Development, School of Social Sciences, Central University of Gujarat. He has to his credit 15 research papers to his credit and nine book chapters from reputed publishers. He has authored two scholarly acclaimed books titled *Epistemes of Death* and *Infrastructure Growth & Human Development in Gujarat*. He has 7 years of experience working on the policy interventions with the Government of Gujarat. He has prepared and contributed to 16 policy intervention documents. He is appraised by the Government of Gujarat for his contribution in developing Outcome Budget, Gender Budget, Development Program, SDG monitoring system, and CM Dashboard. His interdisciplinary research interests' range across sociological aspects related to public policy, governance, information technology, data analytics & visualization, human resources management, labor laws, social policy, gender & women studies, mythology, medical sociology, and development studies.

**Ashis Kumar Pradhan** is currently positioned as an Assistant Professor in the department of Humanities and Social Sciences at Maulana Azad National Institute of Technology, Bhopal, India. He has completed his PhD in Financial Economics from Indian Institute of Technology Kharagpur, India. His current area of research includes International Finance, Corporate Finance, Macroeconomics, and Energy Economics. His teaching interests are Corporate Finance and Macroeconomics.

**Mananage Shanika Hansini Rathnasiri** is a Lecturer attached to the Department of Marketing Management, Faculty of Management Studies, Sabaragamuwa University of Sri Lanka. She serves as an Associate Editor cum Editorial Assistant of the *South Asian Journal of Marketing*, published by Emerald Publishing. She also serves as the Associate Editor of the Sri Lankan Marketer Magazine, published by the Sri Lanka Institute of Marketing. Furthermore, she contributes as the Editor-in-chief of FMS Today published by the Faculty of Management Studies, Sabaragamuwa University of Sri Lanka.

**E. Joseph Rubert**, Professor and Head, Department of Management Studies, Arunachala College of Engineering for Women, Manavilai, Kanyakumari District, Tamilnadu, He has successfully completed his PhD in Management Studies from Noorul Islam University, Kumarkovil. He is the Guest Editor of UGC CARE Listed and Scopus Journals. He has published 35 research articles in various reputed journals including UGC Care, Scopus, Peer Refereed and Conference Proceedings. He is the Editor of 25 ISBN Edited books and has presented

more than 16 papers in various national and international conferences including International Conference conducted by IIT, Chennai. He guided 4 PhD Research Scholars in Manonmaniam Sundaranar University, Tirunelveli. He has organized 7 National, International Conference, 50 Seminars, Workshops and Business Conclaves. He is a Doctorate Committee member of the Department of Management Studies, Manonmaniam Sundaranar University and Nesamoney Memorial Christian College. He is a member of Board of Studies in St. Xavier's College (Autonomous) Tirunelveli. He was the convenor of different academic programs and coordinators of various academic committees.

**Anshita Sachan** is a Research Scholar pursuing her PhD in the department of Humanities and Social Sciences at Maulana Azad National Institute of Technology, Bhopal, India. Her academic achievements include successfully clearing the UGC NET 2019; MPSET 2019 examinations. She specializes in the fields of macroeconomics, environmental economics, and energy economics, showcasing a keen interest in addressing critical issues at the intersection of economics and sustainability. She has authored and published papers in esteemed international SCIE and SSCI journals. She has also presented her research papers at prestigious institutes such as IIT Bombay, India; IIM Bodhgaya, India; and Rajagiri Business School, India.

**Udit Kumar Sahu** is a Research Scholar pursuing his PhD in the department of Humanities and Social Sciences at Maulana Azad National Institute of Technology, Bhopal, India. He qualified UGC NET in the year 2019. His research areas of interests are energy economics, environment, macroeconomics, and financial economics. He has coauthored two research papers published in SCI and SSCI journals. He has also presented research papers in the conferences held at IIT Bombay, IIT Roorkee, and other reputed institutes of India. He has also worked in S&P Global Market Intelligence, Hyderabad, India for one year and seven months.

**Shaik Saleem**, currently working as an Assistant Professor in Finance at VIT Business School, Chennai. He holds a PhD in management and his area of specialization is finance. He has eight years of teaching experience, and his area of interest includes Corporate Finance, Business Valuation, Financial Modeling, capital markets, and mergers and acquisitions. He has participated and presented papers at several national and international conferences. Also, he has published research papers in various journals and conference proceedings.

**Ananya Sarkar** is a recent BSc (Hons) Economics graduate at Dr Vishwanath Karad MIT-WPU University, with a keen interest in macroeconomics, development economics, international economics, and quantitative research. Ms Sarkar has actively pursued academic excellence. She has presented her research findings at two international conferences, showcasing her dedication to advancing knowledge in the field. Ms Sarkar's commitment to rigorous economic analysis developed through various academic and professional research reflects her potential to make meaningful contributions in the field of economics.

**Sapna Sehrawat** is a student in the National Institute of Fashion Technology, Jodhpur, India in the Department of Fashion Management Studies.

**Atreyee Sengupta** is a BSc (Hons) Economics graduate from Dr Vishwanath Karad MIT World Peace University, Pune, India. Her research interests have been in the areas of international economics and trade, labor economics, and developmental economics. She possesses a strong academic foundation and has consistently directed her endeavors toward economic research and analysis. Ms Sengupta participated in several academic research projects in the fields of micro and macroeconomics during her university days and employed various statistical and econometric methods and models. She is a former member of her university's research club and presented some of her research findings at an international conference. In the forthcoming years, Ms Sengupta aspires to delve deeper into her areas of interest through advanced studies while maintaining a commitment to making substantial contributions to the progressive development of knowledge in the field of economics and business.

**J. Sahaya Shabu** is a dedicated Research Scholar currently pursuing her PhD studies at Holy Cross College (Autonomous) in Nagercoil, Tamilnadu, India. Affiliated with Manonmaniam Sundaranar University, Tirunelveli. His research interests span asset pricing, market dynamics, investor sentiment, etc. Mr. Shabu brings a wealth of academic expertise to his research, holding an MBA in finance and marketing. With a passion for advancing knowledge in finance and accounting, he is committed to contributing valuable insights to the academic community. In addition to his current role as a Research Scholar, J. Sahaya Shabu is working as an Assistant Professor in Xavier Institute of Business Administration, Palayamkottai, Tirunelveli.

**Bharti Singh** is a Professor at the Institute of Management Technology Center for Distance Learning, Ghaziabad, Uttar Pradesh, India. She holds a PhD in Economics from the University of Lucknow. She has about three decades of teaching and research experience. Her areas of academic interests include international trade, development economics, environmental economics, and consumer behavior. Prof Singh has supervised PhD candidates, authored books, published research papers in journals, and created academic resources for distance education. She has been associated with corporate trainings at prestigious public and private sector organizations like NTPC, THDC, Genpact, Ericsson, Hero Motocorp Ltd., American Express, RBS, Hindalco, Sopra Steria, Unichem Laboratories Ltd. and Sunlife.

**Dr Anju Singla** is working as a Head and Professor in the Centre of Management and Humanities (CMH), Punjab Engineering College (PEC), Deemed to be University, Chandigarh. Apart from this, she has also served as a Head of the Entrepreneurship and Incubation Cell, President of Institute Innovation Council, PEC under MHRD Innovation Cell (MIC), Govt. of India and Coordinator of National Innovation and Startup Policy (NISP) under AICTE. She has twenty-two years of teaching and research experience in Management and Finance. Her research areas include Micro Financing, MSMEs, Entrepreneurship, Financial Inclusion, Financial Literacy and Financial Technology (Fintech). She has published more than 80 research papers in

reputed International/National Journals and Conference Proceedings and presented papers in numerous International/National Conferences and Seminars. She has also completed a course on “Entrepreneurship in Emerging Economies” from Harvard Business School, Harvard University.

**Sonika Siwach** is an Assistant Professor with the Department of Fashion Management Studies in National Institute of Fashion Technology, Jodhpur. She is a NIFT graduate in Fashion Technology and MBA in Operations. She has worked in the Fashion e-commerce industry for a decade as Category Manager, Buyer and Merchandising Manager. She specializes in Online Retailing, Fashion Merchandising, and Digital Marketing. Her research interests are based on fashion business landscape and e-commerce development.

**Prihana Vasishta** is a Senior Research Fellow at the Center of Management and Humanities (CMH), Punjab Engineering College (Deemed to be University), Chandigarh, India. Her research interests include FinTech Adoption, Financial Literacy, Financial Inclusion, and Artificial Intelligence. She has participated in various international conferences and also been a reviewer for some reputed journals indexed in Scopus. She has delivered expert presentations/ invited talks on various topics such as Startups, Academic Research Writing, Cyber security and Financial Literacy.

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## Chapter 1

# Forecasting Major Macroeconomic Variables of the Indian Economy

*Bhavya Advani, Anshita Sachan, Udit Kumar Sahu  
and Ashis Kumar Pradhan*

Maulana Azad National Institute of Technology, India

### Abstract

A major concern for policymakers and researchers is to ascertain the movement of price levels and employment rates. Predicting the trends of these variables will assist the government in making policies to stabilize the economy. The objective of this chapter is to forecast the unemployment rate and Consumer Price Index (CPI) for the period 2022 to 2031 for the Indian economy. For this purpose, the authors analyse the prediction capability of the univariate auto-regressive integrated moving average (ARIMA) model and the vector autoregressive (VAR) model. The dataset for India's annual CPI and unemployment rate pertains to a 30-year time period from 1991 to 2021. The result shows that the inflation forecasts derived from the ARIMA model are more precise than that of the VAR model. Whereas, unemployment rate forecasts obtained from the VAR model are more reliable than that of the ARIMA model. It is also observed that predicted unemployment rates hover around 5.7% in the forthcoming years, while the forecasted inflation rate witnesses an increasing trend.

*Keywords:* Forecasting; inflation; consumer price index; unemployment rate; ARIMA; VAR

## 1. Introduction

The Reserve Bank of India (RBI) underlines that the Indian economy is confronting the strong headwinds of global recessionary risks with sound macroeconomic fundamentals (RBI Press release, 2022). The fifth largest economy of the world has been able to stand firm amid the COVID-19 pandemic and the

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Modeling Economic Growth in Contemporary India, 1–24

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doi:10.1108/978-1-80382-751-320241001

Russia–Ukraine war. India occupies a significant place in the world economy as it contributes 7% to the global GDP (in purchasing power parity) which is the third highest after the United States and China ([World Bank blog, 2019](#)). Additionally, in terms of GDP growth, India is the second largest emerging economy after China and shares 16% of the global GDP growth ([World Economic Forum, 2024](#)). The country is also a prominent member of major international trade blocks such as G-20 and BRICS.

The economic march of India, however, has been quite challenging over the years. Every decade since 1990, India is undergoing an economic crisis. First in the year 1991, India faced the balance of payment emergency and currency crisis that prompted the country to liberalize its economy and integrate with the world economy. Further, in the year 2008, the country experienced twin deficit problem which was ensue of the global financial crisis. Later in the year 2015–2016, the Indian economy started experiencing a slowdown as several indicators, viz. GDP growth, private investment, consumption demand and a number of new projects encountered a declining trend ([Upadhyay, 2019](#)). The monetary and financial sector also got affected and the country's fiscal deficit shot up to 4.6%, higher than the anticipated figure of 3.5% in the year 2019–2020 ([Dev & Sengupta, 2020](#)). Further, in the year 2020, the COVID-19 pandemic afflicted the country and aggravated the state of affairs of already falling Indian economy. The GDP of the country contracted by 23.9% in the first quarter and subsequently by 7.5% in the second quarter of the year 2020 ([Economic Survey, 2020–21](#)). The two major contributors of Indian economy – manufacturing and service sector, were badly hit due to the nationwide lockdown imposed by the Government. Nevertheless, agriculture was the only sector that witnessed a positive growth during the first wave of COVID-19.

The COVID-19 emerged as a health crisis and gradually transformed into an economic crisis across the globe. It impacted the world's major economies resulting in 3.4% decline in their collective GDP ([Statista, 2023](#)). For a highly populated Indian economy with high population density, greater population of elderly people and with 69% of total population living in rural area, it was unlikely to escape from such crisis ([Economic Survey, 2020–21](#)). Despite these impuissance and vulnerabilities, the economy of India was able to recover faster than its counterfeits during the pandemic. The faster recovery can be attributed to the introduction of supply side measures, structural reforms and demand reforms. Moreover, India is witnessing a V-shaped economic recovery and the performance of Indian economy post pandemic has been phenomenal. According to the projections made by the Asian Development Bank (ADB), the International Monetary Fund (IMF) and the World Bank, Indian economy will be the fastest growing economy in the world during the year 2021–2024. It is also expected to grow up to five trillion dollar economy by the year 2025 ([Sawhney, 2021](#)). Looking at the growing prominence of the Indian economy, we take a keen interest to look into the trends of certain macro-economic variables of the country and predict their future prospects. In the context of economic development, inflation and unemployment are a couple of factors that hold a direct impact on the general mass of the country as explained theoretically by the Phillips curve. At

the same time such factors get majorly affected in case of a crisis. For instance, CPI was among the most affected variable during the COVID-19 pandemic. CPI measures prices at the retail level and determines the general purchasing power of the consumers. At the time when the zoonotic virus started spreading at the global level, people were very uncertain about the longevity of the virus among humans. As a result, people started hoarding necessary goods in their houses which resulted in an increase in overall prices. Citing another instance, during the fall-out of Russia–Ukraine war, the CPI peaked to 7.8% in April 2022. However, the figure moderated to 5.7% in December with the prompt and adequate efforts made by the RBI and the Government of India ([Ministry of finance, Press Release, 2023](#)). Therefore, frequent investigations into the trends of general prices in the second largest emerging market become crucial as the variable also holds a close link with the standard of living of the people.

Similarly, unemployment is another significant element which is frequently discussed at every level of the economy and society. Unemployment constrains the income level of the population which can further limit the per capita income of the country. Notably, as per [Lai et al. \(2021\)](#) the COVID-19 pandemic created a challenging scenario of employment in India. Given this, the study attempts to forecast the CPI inflation and unemployment in India by using Box–Jenkins' ARIMA model along with VAR model. The two noble models also enable us to make a comparative analysis of the results obtained from the same. The study is based on a time series dataset ranging from the period 1991 to 2021 and provides a forecast of the two variables up to 2031.

The current study enhances the extant literature in several aspects. First, the study's data period encompasses a series of crisis including East Asian financial crisis, the global financial crisis and the pandemic period. Second, we employed ARIMA and VAR forecasting models in our study which are considered better than the other estimation techniques namely exponential smoothing. Moreover, our findings provide a comparative analysis about the trend prediction of the CPI and unemployment. Third, the study is based on India, the second largest emerging economy worldwide. Examining the trend and accurately forecasting the variables CPI and unemployment in such an economy is itself a challenging chore. Finally, the study will also suggest appropriate policies and direct the regulatory bodies to be vigilant about the future phase of any crisis.

## **2. Theoretical Framework**

Inflation is the persistent increase in the general price level of services and goods within an economy ([Omar et al., 2022](#)). It declines the purchasing power of the currency. It is a monetary phenomenon which is affecting most economies of the world, both developed and developing ([Abdulrahman et al., 2018](#)). Different theories of inflation are given by various economists. For instance, classical economists believed in full employment and operation of Say's law in an economy, which is supply creates its own demand. According to Quantity theory of Money (QTM) given by Classical economist, Irving Fisher, there is a direct and

proportional association between quantity of money and price level. This relationship is described by an equation of exchange,  $MV = PT$ , where  $M$  denotes money supply,  $V$  stands for circulation or velocity of money,  $P$  refers to the general price level index and  $T$  is the volume of trade. The velocity of money ( $V$ ) in any economy is determined by institutional factors that are constant in the short run. The volume of trade or transactions ( $T$ ) is also assumed fixed under the scenario of full employment level. Therefore, any variation in money supply will have a proportionate change in the level of prices. A change in money supply ( $M$ ) impacts aggregate demand, and with aggregate supply being fixed at full employment level, it will cause inflation (Fisher, 1911). However, Keynes and his followers believed that the non-monetary impulses are responsible for changes in price level (Gordon, 1976).

According to Keynes, when the economy reaches beyond full employment level, increase in aggregate demand is responsible for rise in the price level. Beyond full employment level, aggregate supply of goods and services cannot be altered. So, any change in aggregate demand in the form of consumption expenditure, investment expenditure or government expenditure, will have a direct influence on the price level. Therefore, at full employment level, when aggregate demand exceeds aggregate supply, an inflationary gap is created in an economy. This inflationary gap will lead to price rise in an economy which is termed as demand pull inflation.

The Monetarist school of thought also contributed towards theory of inflation. According to them, a rise in aggregate demand, due to change in money supply, is responsible for increase in the price level. Milton Friedman is the main proponent of the monetarist school. There is similarity between Keynesian and Monetarist schools, as both these schools have considered aggregate demand responsible for rise in price level. However, in Keynesian school, increase in aggregate demand is due to change in components of aggregate demand (autonomous investment, government expenditure or consumption expenditure or net exports), which is independent of money supply. Whereas, monetarists considered fluctuations in money supply responsible for any changes in aggregate demand (Totonchi, 2011).

In any economy, prices of goods are determined by their cost of production. Therefore, alteration in cost of production, due to any reason, will have a direct impact on price. The alteration in cost can be due to supply shocks, raise in wage rate or higher profit motives among many reasons. This resultant increase in price due to rise in cost of production is known as cost push inflation. Here, increase in cost takes place without any change in aggregate demand. Hence, a price increase, without any change in wage rate, will lead to price wage spiral in an economy. Due to rising prices, wage earners will seek greater nominal wages, in order to keep their real wages to the same level as before. This rise in wage rate will further lead to rise in prices and this process continues. This type of inflation is also called price-push inflation (Gordon, 1976; Totonchi, 2011).

Besides inflation, unemployment is another unsettling issue which affects both developing and developed economies (Dev & Venkatanarayana, 2011). Unemployment is a situation when there is scarcity of jobs for the employable and willing labour force of a country. There can be multiple scenarios that lead to

unemployment in an economy. As per Singh and Verma (2016), unemployment usually arises when there is a mismatch between the demand and supply of labour in the labour market. That is, the demand of labour is less than the supply of labour.

The unemployment rate is measured by total unemployed labour force as a percentage of labour force (PIB, 2022a). Labour force refers to the people in the population who are either seeking work or already working (PIB, 2022a). The unemployment rate in India is measured based on usual status, current weekly status and current daily status (Dev & Venkatanarayana, 2011). The Ministry of Statistics and Programme Implementation (MoSPI) and the National Statistical Office (NSO) are responsible to gather data on unemployment and employment for Indian economy and for conducting periodic labour force survey (PIB, 2022b).

Inflation and unemployment are among the crucial indicators of the health of an economy. Notably, the two indicators are also associated with each other as exhibited by A.W. Phillips. In the 1960s, A.W. Phillips introduced the concept of the Phillips curve, depicting an inverse association between the wage rate (inflation) and unemployment level. The Phillips curve shows that a rise in the wage rate will lead to a fall in unemployment, and a decline in the wage rate will result in an increase in unemployment. Therefore, in any economy, inflation can be managed by altering the level of unemployment (Totonchi, 2011).

The further stage of the Phillips curve is given by Phelps and Milton Friedman and is called natural rate of unemployment hypothesis. This stage distinguishes between a short-run and long-run Phillips curve. In the short term, there is a negative association between inflation and unemployment, but over a period of time, unemployment becomes stable and does not alter with any change in the inflation rate. This stable unemployment rate is known as the natural rate of unemployment, and the Phillips curve is a vertical, straight line at this level. This stage of Phillips Curve is based on an assumption that people make expectations about inflation on the basis of adaptive or past expectations (Frisch, 1983).

The latter stage of the Phillips curve is given by new classical or rational expectation economists. In this approach, there is no distinction between the short-run and the long-run, and the Phillips curve is a vertical straight line at the natural rate of unemployment level. It is based on the assumption that economic agents act rationally and take decisions on the basis of all the past and current available information (Totonchi, 2011).

### **3. Literature Review**

Forecasting is the mechanism of predicting future trends on the basis of prior data. There has been a quest in the extant literature regarding the appropriate selection of models for forecasting.

One side of literature views linear models are better in forecasting than non-linear models (Awel, 2018; Liu et al., 2012), while the other side offers an opposing view (Marcellino, 2008). However, economic indicators for different

countries can be forecasted by using either or both the methods. In time series forecasting, the statistical and primitive methods of forecasting are considered linear, whereas Artificial Neural Networks (ANN) emerged as a non-linear tool (Stock & Watson, 1998). For instance, in the study by Awel (2018) the economic growth for Ethiopia is predicted for the period 2015 to 2017 by considering the sample from the period 1980 to 2014, by employing the Box–Jenkins Approach. The study discusses the importance of the univariate time series model in a data limited environment and also compares the prediction precision of the univariate model with other forecasters. It is found that the ARIMA (1,1,1) model performs better than the IMF World Economic: Forecasting GDP Growth Outlook (1990–2014) and World Bank Global Economic Prospects (2007–2014) forecasters based on Root Mean Square Error (RMSE) and Mean Absolute Errors (MAE). In addition, the study proposes to look into the VAR model to improve the forecasting. In a similar study, Rahman et al. (2019) uses Exponential Smoothing and ARIMA model to project the ten years growth rates of Bangladesh by taking the data for the period 1982 to 2018. In another study by Liu et al. (2012) the real economic growth for ten Latin American countries namely Brazil, Ecuador, Argentina, Venezuela, Dominican Republic, Chile, Peru, Mexico, Colombia and Uruguay is estimated by using five models: bridge equations, autoregressive model, Bayesian VAR (BVAR) model, dynamic factor model (DFM) and bi-variate VAR model. Moreover, the author evaluates the quarterly nowcast and estimates the quarterly value. The author observes that the auto-regressive model provides reliable and more accurate results using monthly data than quarterly data. Secondly, the nowcast and forecast results of the DFM model are more precise than other used models. And lastly, external indicators improve forecast values for most Latin American economies. Marcellino (2008) also conducted the study using the real-time data for the USA from the period 1980 to 2004 and analysed whether complicated time series models perform better than linear models in forecasting economic growth and inflation by employing fifty-five alternative sequences. The comparison results obtained are evaluated using a bootstrap algorithm. The author concludes that linear models outperform the non-linear models, and their relative performance is better assessed using out of sample evaluation.

However, Higgins et al. (2016) predict the economic growth and CPI inflation of China for the time period 2011 to 2015 by employing BVAR methodology and other competing models. These models are Benchmark model, the BVAR model with Sims–Zha (SZ) US prior, No Prior VAR model, Blue Chip Economic Indicators (BCEI) forecasts, the BVAR model with PLR prior, the gold standard random walk model, the BVAR model with Minnesota prior, the BVAR model with GLP prior, auto-regressive (AR) model without trend, that is AR(1), AR(6) and AR(12) and AR with trend at AR(1), AR(6) and AR(12). On the basis of comparative results, it is proven that the benchmark model yields much more reliable outcomes. Similarly, Chuku et al. (2019) depict the benefits of using ANN and non-parametric models for developing economies and observe that ANN have superior accuracy in predicting economic growth than ARIMA and structural econometric models in developing economies that are exposed to chaotic

factors and external shocks. The economic growth is estimated for South Africa, Kenya and Nigeria using primary commodity prices, inflation, trade intensity and interest rates by using the data from 1970 to 2016.

The study by [De Gooijer and Hyndman \(2006\)](#) throws light on the overall time series forecasting literature. The authors consider the period from 1982 to 2005 and cover nine hundred and forty papers that are summarized and classified either by models or by problems they addressed or on several issues. It is observed that the proportion of papers concerned with time series forecasting is constant over time. However, the quality of papers has changed over time in terms of statistical models, forecast calculation approaches and evaluation tools.

With regards to the variables, inflation is an important macroeconomic variable which is widely considered by researchers globally for predicting in advance. To forecast the inflation rate of different countries, the ARIMA method is highly used by several researchers. ARIMA method is generally used because of its ability to handle all types of data – stationary, non-stationary or seasonal ([Chuku et al., 2019](#)). The study made by [Youness and Driss \(2022\)](#), estimates the dynamics of inflation rate for Morocco by considering the data from 1971 to 2019 using the ARIMA model. The inflation rate is estimated for five years from 2020 to 2024 and findings reveal that ARIMA is the appropriate method for forecasting and ARIMA (0,1,1) provides the best result. Similarly, [Omar et al. \(2022\)](#) use the inflation data of Egypt from the year 2018 to 2022 in order to predict five months' inflation rate from August to December 2022 and found that ARIMA (1,1,1) is an appropriate model to foresee inflation rates. Likewise, [Vafin \(2020\)](#) forecasts the major macro-economic indicators, namely real exports, real investment, real consumption and real GDP, in the context of seven major economies, viz. China, France, India, Japan, Russia, the US and the UK using the ARIMA forecasting technique for the period 2020–2024. Varying results are obtained for different economies. For India, the author finds that the inflation rate will rise from a projected 6.19% in 2020 to reach 7.842% in 2021 and will be stable in subsequent years, from 2021 to 2024. The author also predicts the unemployment rate to rise in the same period. In a similar fashion, [Abdulrahman et al. \(2018\)](#) conducted a study on the Sudan economy. The authors employ the ARIMA methodology to estimate the inflation rates for the period 2017–2026 by taking annual data from the period 1970 to 2016 and find that the ARIMA (1,2,1) is an appropriate model for prediction and that inflation will increase in the coming years for Sudan.

On the similar grounds, [Adubsi et al. \(2018\)](#) predict inflation rate of Nigeria for a six-year period from 2015 to 2020 by using the data from 2006 to 2017. The findings of the research suggest that the ARIMA (1,2,1) produces best forecasted values with minimal forecast errors. [Ahmar et al. \(2018\)](#) conducted a study on the Indonesian economy by taking the data from January 2005 to December 2015 and confirm that the model ARIMA (1,0,0) produces best results. Similarly, [Habibah et al. \(2017\)](#) forecast inflation for the period 2017–2021 in the context of SAARC region by considering the economies of Pakistan, Sri Lanka, Bangladesh and India. By considering yearly data for the period 1981–2016, the authors find that the inflation rates will be higher in future for the SAARC region but still is lower than the average inflation rate of the prior year.

Several models other than Box–Jenkins ARIMA are also used to forecast inflation values. [Gjika et al. \(2018\)](#) use the multiple regression model and seasonal autoregressive integrated moving average (SARIMA) model to predict CPI of Albania for the years 2017 and 2018. The authors opine that for a short-term graphical projection, the results of SARIMA model are more satisfactory than that of multiple regression models. Similarly, [Thakur et al. \(2016\)](#) analyse the monthly data for inflation in India for the period January 2000 to December 2012 and predict the inflation for the year 2013 using feed forward back propagation neural networks. As per the authors, satisfactory results are obtained by using neural networks model. The authors also identify a set of variables namely, GDP, exchange rate, imports and exports, foreign reserves and oil and gold prices as significant factors impacting inflation in India. With the quest to find out the best model to forecast, [Hussain et al. \(2022\)](#) employ both ARIMA and ANN to forecast inflation rates, GDP and exchange rate for Pakistan economy. It is found that ANN-based forecasts are more precise to estimate inflation as compared to the ARIMA model. However, ARIMA-based forecasts are comparatively better to predict GDP and exchange rate than that of the ANN model.

The study by [Jose et al. \(2021\)](#) tests the suitability of a Phillips curve relationship for forecasting CPI inflation using ARIMA and SVAR models in the context of India. The out of sample forecast are obtained for the period 2017–2018: Q4 to 2019–2020: Q4 by using the data from the period 1996–1997: Q1 to 2017–2018: Q3. The findings confirm the existence of Phillips curve relationship. Secondly, it is found that while Phillips curve-based models perform better for four-quarters ahead forecast horizon, the univariate models (SARIMA) outperform in forecasting one-quarter ahead inflation in the case of core inflation. Thirdly, SVAR model proved useful for assessing the impact of different shocks on inflation.

The inflation rate of any economy is affected by several factors. [Totonchi \(2011\)](#) reviews and analyses the theories of inflation and reveals that the origins of inflation can be attributed to any of these mentioned factors, mainly supply side shock, demand side shock, monetary shocks, political factors (or the role of institutions) and structural factors. Also, it is observed that inflation is a consequence of dynamic interactions of these independent variables. The author also observes that it is not easy to attribute observed inflation into any one of its components. The author asserts that inflation is always an institutional and macro-economic phenomenon and inflation itself has a tendency to cause further inflation. Likewise, [Osorio and Unsal \(2013\)](#) discussed the inflation dynamics in Asia using Global Vector Autoregression (GVAR) model and Structural Vector Autoregression (SVAR) model. The authors analyse the impact of demand shock and supply shock in price rise and the extent to which these shocks are derived from foreign and domestic sources. In analysis, demand sources comprise output gaps and monetary shocks (interest rates, money supply and exchange rates) while supply factors comprise producer prices and commodity prices. The author uses the GVAR model for thirty-three countries over the period from 1986 to 2010. It is observed that supply pressures and monetary pressures are major forces for driving Inflation in Asia while demand shocks have played a relatively smaller