Macroeconometric Models for Portfolio Management

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Series in Economics
VERNON PRESS

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www.vernonpress.com

In the Americas: Vernon Press 1000 N West Street, Suite 1200, Wilmington, Delaware 19801 United States *In the rest of the world:* Vernon Press C/Sancti Espiritu 17, Malaga, 29006 Spain

Series in Economics

Library of Congress Control Number: 2020950199

ISBN: 978-1-62273-884-7

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Preface

Macroeconometric models have become the fundamental tool in the academia and central bank community. It is now almost impossible to have a rigorous understanding of the global economies without such tools. The widespread use of macro models, particularly DSGE and increasingly GVAR models in the policymaking community, shows the usefulness of these models for analyzing and simulating economic experiments. Given the cheap data access and numerous software available for the users, the importance of macro models will only increase.

One area that is under-researched by the macroeconometric community is portfolio management. Often we can find numerous academic papers on macro models but are not related to portfolio management. In practice, the financial industry has a long track record of applying macroeconomic analysis for portfolio management but rarely refers to the academic literature of macroeconometrics. However, this trend is now changing as more systematic fund managers are employing quantitative models to forecast and trade their portfolio positions. The rise of algorithmic and systematic trading has driven the explosion of research in high-frequency econometrics, quantitative finance and machine learning as practitioners are keen to discover a more efficient, automatic way to model the economy and forecast the actions while staying profitable.

This book offers a detailed explanation of the various types of macro models and shows their applications by demonstrating with empirical tests. For each model, it begins with the construction, calibration/estimation and simulation. The book is intended for readers who have training in economics but have not yet been exposed to the research in macroeconometric models. Practitioners who work in the industry would also find it very handy as a guide to all major macro models and how they can be applied to portfolio management.

The first part of this book introduces the basics of financial-economic theories and how they are related to portfolio management. The second part looks at all major models that are found in macroeconometrics, such as DSGE, GVAR and FAVAR. It also contains chapters on volatility models such as GARCH. Numerous software packages are available either for free or at a low cost for the reader to apply these models.

The last part is focused on bringing the models to a portfolio management context. The most important purpose of this part is to demonstrate how macro model forecasts can be applied and translated into actual trading positions in light of the risk and reward preference by the investor. A backtesting workbook is also included, and the reader will be able to backtest trading strategies with inputs from the forecasts. It allows the reader to enter either a long or short position based on the forecast. The reader can also fine-tune criteria such as expected risk and trading size. Returns will be calculated automatically to show whether the forecast and the trading strategy worked. The workbook can be downloaded from the book's homepage on Vernon Press.

It is my hope for this book to be a bridge between academia and industry. I'll be very grateful if the reader is encouraged to further pursue the subject matter.

Jeremy Kwok, London, 2021

List of acronyms

2SLS	Two-Stage least squares
3SLS	Three-stage least squares
ACF	autocorrelation function
ADF	Augmented Dickey-Fuller test
AIC	Akaike information criterion
APT	Arbitrage Pricing Theory
APW	APW statistic
AR	Autoregressive
ARCH	Autoregressive conditional heteroskedasticity
ARIMA	Autoregressive integrated moving average
BOE	Bank of England
BVAR	Bayesian VAR
CAPM	Capital Asset Pricing Model
CC	Cowles Commission
CUSUM	Maximal OLS cumulative sum statistic
DGP	Data generating process
DOF	Degree of freedom
DSGE	Dynamic stochastic general equilibrium model
ECB	European Central Bank
EMH	Efficient Market Hypothesis
ETF	Exchange-traded fund
FAVAR	Factor-augmented VAR
FED	Federal Reserve System -central banking system of the US
FOC	First-order conditions
FTSE	Financial Times Stock Exchange. The most prominent index being the FTSE100 for the UK market
G7	Group of Seven
GARCH	Generalised ARCH

GIRF	Gross domestic product
ond	Generalised impulse response function
GLS	Generalised least squares
GMM	Generalised Methods of Moments
GVAR	Global VAR
IMF	International Monetary Fund
IRF	Impulse response function
IV	Instrumental variables estimation
JBT	Jarque-Bera test
LM	Lagrange Multiplier Test
MA	Moving Average
ML	Maximum Likelihood
MW	MW statistic
OMX	OMX Nordic - shares from the four stock markets in the Nordic countries
NF	No forecast
NYMEX	New York Mercantile Exchange
OFEVD	Orthogonalised forecast error variance decomposition
OIRF	Orthogonalised impulse response function
OLG	Overlapping-generations model
OLS	Ordinary least squares
OPEC	Organization of the Petroleum Exporting Countries
P&L	Profit and loss
PCA	Principal component analysis
PC	Principal components
	Quantitative Feeing
QE	Quantitative Easing
QE QLR	Quandt statistic
QLR	Quandt statistic
QLR RBC	Quandt statistic Real Business Cycle

- SEM Simultaneous equations model (Cowles Commission approach)
- SMA Simple moving average
- SVAR Structural VAR
- TFP Total factor Productivity
- VAR Vector autoregression
- VaR Value at Risk
- VARX VAR with exogenous variables
- VECM Vector error correction model
- VECMX VECM with exogenous variables
- VR Variance Ratio test
- WTI Crude oil West Texas intermediate

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Part I: Overall Framework and Financial Theories

Chapter 1

Introduction

1.1 Crystal balls

Imagine that you now have a crystal ball in front of you and it shows you the future. Just like the ones in fortune-telling, it tells you the future. It shows you exactly what will happen in the markets. What, then, does this knowledge of the future bring to you now? Most importantly, how are you going to act since you have glimpsed the future from this omniscient, prescient object? Does it imply that you will now become all-powerful and live happily forever?

Unfortunately, the short answer is no.

The long answer is it depends but it is complicated. Specifically, it depends on the crystal ball you have and, secondly, how you are going to act on it. The crystal ball-be it an oracle from insiders or a mathematical model which takes all the available information into account-will burp out forecasts that may or may not be accurate with a margin of error. Not only the output from the crystal ball can be inaccurate, but it can also be inappropriate, not suitable for actions. Even if the forecast is actionable, the logical question will then be: what are you going to do and how, exactly? Despite all these problems, the reader is tempted to ask: why bother forecasting? The answer is simple. The need to gain insight into the future will always be with us. It is a fundamental human urge to all things we do. This is an action that we cannot avoid and should be dealt with precisely. The crystal ball is certainly attractive, but the silver bullet isn't. Therefore the answer to this question is half crystal ball and half application of the crystal ball. To solve the problem of the crystal ball itself, this book seeks help from macroeconometrics. For the application of the crystal ball, it looks for the science and art of portfolio management.

The purpose of macroeconometrics is to model the national or global economies, thus enabling the modeller to create forecasts and simulations to predict what will happen in the future. This field has always been very attractive to not only academia but also central bankers and policymakers. This is evidenced by the wide adoption of the models in central bank research bodies such as the European Central Bank, the Fed, and the Bank of England. As a result, applications developed are mostly for monetary, fiscal and growth policy analysis. The publication of research related to macroeconometric models has been ever-increasing recently due to the available tools for computing these models. This allows the user to build complex models quite easily. As such, the application of this field is also of important interest not only to academia but also in the private sector due to its accessibility. Like other academic disciplines, macroeconometrics

also have different schools of thought with widely different approaches. In light of the failure of previous macro models, many solutions have been put forth. In general, there are two broad camps of models that are either data-driven or theory-driven, while some are in between. One of the most promising approaches that are data-driven but also allowed for theory is the method of Global Vector Autoregressive (GVAR) models. The GVAR approach is closely related to the VAR modelling approach but provides a relatively simple yet effective way of modelling interactions in a complex high-dimensional system such as the global economy, where it can contain many variables for each country. Other existing large models, such as the simultaneous equations model (SEMs) and Dynamic stochastic general equilibrium models (DSGEs), are the main working models in academia and industry. It is easy to see the values these models bring to decision-making in the context of portfolio management. Having a correctly estimated model is similar to holding a crystal ball informing the future. While there is no shortage of research for applications in the public sector, such as national government and central banks, there is little research on how to integrate these models for portfolio management in the industry.

Portfolio management is the economic science for determining an investment policy (such as buying equity for a long period, e.g., 20 years), forecasting returns (such as variables like GDP growth, inflation and their effect on equity or commodity prices), asset allocation (determining the portion of assets to allocate for the portfolio) and risk management for a portfolio of investments. This art is practised by fund managers, bankers and even ordinary retail investors. A fitting and accurate model for forecasting can generate enormous wealth for its users, and, therefore, it is easy to see that the models being used by private fund management companies are proprietary and are never publicized. In light of this knowledge gap, this book aims to fill the void by proposing a framework and application integrating macroeconometric models for managing a portfolio while considering its role in forecasting, asset allocation and risk management. An excel file with examples is also available to allow readers to use it immediately.

1.2 Overall framework

By the end of this book, the reader will be able to have an in-depth understanding of macroeconometric models and how to apply them to their portfolios. This book is presenting a new framework for economists and investors. However, it is not just a theoretical presentation. Readers will learn how to estimate the models and apply the forecasts into their portfolio with a backtested strategy. Specifically, the ensuing chapters in this book attempt to answer these questions:

- 1) Which forecast models to use and how to estimate?
- 2) Once estimated, how to validate whether the models work?
- 3) How to forecast from the models?
- 4) How to use forecasts as part of portfolio management?

- 5) How to backtest a trading strategy, given the forecasts?
- 6) How to translate the forecasts into trading positions given the risk and reward criteria?

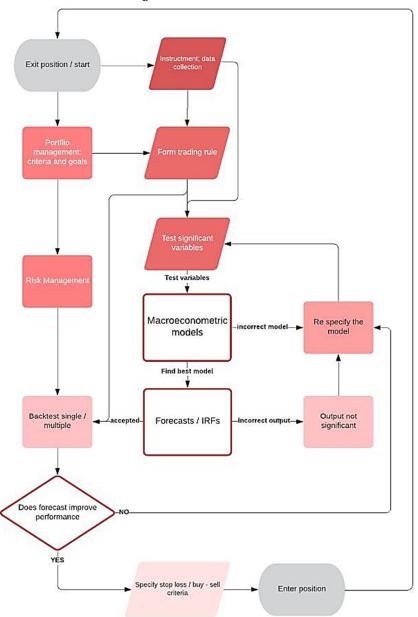


Figure 1.1: Overall framework

An overall framework in figure 1.1 shows the flow of different components in this book. The framework connects the macroeconometric models to a backtesting workbook. The book follows this framework which shows the reader how to understand and apply the macroeconometric models (Part II, chapter 4-7), calibrate/estimate (chapter 8.9), produces forecasts and assesses their merits (chapter 9). Having produced the forecasts, part III of the book looks at the beginning, where the investor outlines an investment policy with criteria and goals (10). Trading rules that are fitted are then backtested in chapter 11. The last chapters (13, 14 and 15) then show the reader how this can be done with the excel workbook provided. After assessing the trading rule and forecast in light of the risk and rewards outlined in the portfolio criteria, the reader will be able to test and confirm which model is the best that allows maximum returns.

1.3 Road map

The book is divided into three parts. The first part introduces the overall framework and how classic financial theories are related to predictability and portfolio management. There are six chapters in part II. The CAPM model and EMH theory are the focus here as they are too influential to ignore by any modellers. The portfolio management chapters in Part III relate to chapters 1 and 2 by asking the readers' beliefs and how much they rely on the CAPM and EMH theory.

The chapters in part II first take the reader to the historical development of macroeconometrics before embarking on a journey to the major types of macroeconometric models. Chapter 4 provides an extensive account of the development within the field from the beginning of econometrics up to the recent research in DSGE and GVAR. Chapter 5 begins with a short demonstration of the smaller VAR models and their limitations, thus showing the need for larger, macro models. Chapter 6 also looks at the popular GARCH type models and show empirical tests on the assessment of these models. GARCH models are often used for modelling volatility. This chapter provides an option for the reader to use when estimating the expected risk of financial instruments in part II. Chapter 7 examines all major types of macro models such as GVAR, FAVAR and DSGE and how are they constructed, tested, and used for forecasting. The large scale models are notoriously difficult to estimate, and this has been treated with extensive care. Chapter 8 shows an experiment on how to validate and compare model performance. A forecasting contest was conducted between GVAR, FAVAR and DSGE models.

Part III is more practical and focuses on how to apply the models to use. Chapter 10 discusses how to formulate portfolio risk and reward and forecasts. Chapter 11 focuses on trading rules and how to backtest them. The last three chapter shows how to backtest a trading strategy with the aforementioned portfolio criteria of risks and reward. It also shows how forecasts can be translated into an actual trading position. The final backtesting chapters 13 and 14 show that trading with accurate forecasts is much more profitable. The reader is advised to use the excel workbook when reading these chapters.

The workbook shows how the backtest can be applied to check whether a strategy would be profitable, given the historical data and trends. The first sample given is a simple backtest for testing one position strategy. This allows the reader to hold one position at any time, either buying or shorting. Therefore the reader's net position can either be short (-1), no holding (0) or long (+1). The indication of buy or sell here is indicated by the underlying strategy, which is described in the book. Once a signal is given, the reader will either buy or sell the underlying security. The profit and loss for each trade are calculated, and cumulative return is also calculated to provide a comprehensive picture.

The second part of this workbook is a backtest template that allows multiple positions. It also includes portfolio management criteria and tools that were mentioned in chapter 10. This allows the trader to backtest if holding multiple positions within the same instrument is a better strategy or not. Detailed portfolio criteria are also in place to adjust the position size to be traded, according to the risk criteria as stipulated at the start. This part was designed with flexibility in mind so that the reader can test multiple scenarios with the same dataset but with different criteria.

PAGES MISSING FROM THIS FREE SAMPLE

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