Forecast Adjustment Under Shocks: A Unification

David Lundquist, Daniel Eck

Department of Statistics, University of Illinois at Urbana-Champaign

June 18, 2024

Abstract

This work systematizes and unifies the rich landscape of model adjustment and model correction methods, with a special focus on forecast adjustment under the presence of shocks.

1 Introduction

With many prediction tasks in time series in panel data, the salient challenge is not predicting when an event will occur but what its direction, sign, magnitude, duration, and/or after-effects will be. This is not to say that predicting when a given event will occur is easy. In some cases, it may be difficult or impossible, and in those situations in particular, preparing for the shock is the best one can hope for.

This work focuses on model adjustment admidst structual shocks that undermine the reliability of the base model. Forecasting amid anticipated shocks raises unavoidable questions: should the forecast model be abandoned in favor of a discretionary or ad-hoc or one-off adjustment? Does the does the discretion of a forecaster rule out a quantitative method for making the adjustment? What is the ultimate purpose of the adjustment, and how it is to be used? For how long is the adjustment necessary or reliable?

Herein we systematize and unify a range of conceptual approaches and tools that have developed across the broad ecosystem of the econometric and forecasting literatures.

difference between discretionary and automated [Hendry and Clements, 1994]

Setting the model back on track [Hendry and Clements, 1994]

what we are talking about here is not forecast combination, but there may be, nevertheless, a role for forecast combination: combining the forecasts generated by small differences in covariate and/or donor choice

The role and meaning of similarity

How important is a shared DGP?

Bias-variance tradeoff and MSE decomposition

^{*}davidl11@ilinois.edu

 $^{^\}dagger dje13@illinois.edu$

Mismeasured data is discussed in [Hendry and Clements, 1994, p. 166] as a motivator for intercept correction. Could similarity-based correction help?

The forecast horizon — does it matter? If so, how so? Lin and Eck [2021] has a one-period horizon. Clements and Hendry [1998]p. 203 discuss how long to keep the forecast adjustment in place. For a corrected "slope parameter", the effect of h is not so clear.

1.1 Literature Review

Three Clements and Hendry books

- 1994
- 1998
- 1999

Quinton-Guerrera and Zhong

1.2 Model Adjustment Using Similarity-Based Parameter Correction: A Global Overview

- 1. a random object to forecast that depends on a linear specification
- 2. a parametric model family shared by donors
- 3. a correction term for the model family shared by donors
- 4. a parametric specification for the correction term
- 5. a reliable estimation procedure for the shared model
 - (a) This should be straightforward
- 6. a reliable estimation procedure for the correction term
 - (a) This might not be straightforward. Some models like GARCH, for example, might deliver very noisy estimates for indicator variables that occur just once.
- 7. a correction function that aggregates (i.e. maps) donor correction terms based on some notion of similarity

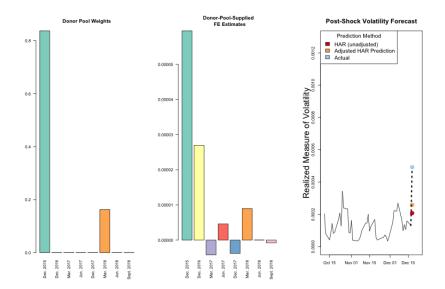


Figure 1: Volatility series of six i.i.d. GARCH processes, each of which experiences a volatility shock, indicated with a red vertical line, at a uniformly distributed point in the set $\{756, ..., 2520\}$ of trading days, corresponding to between 3 and 10 years of daily trading data.

- 2 Setting
- 3 Model-Specific Considerations
- 3.1 ARIMA
- 3.2 GARCH
- 3.3 HAR
- 3.4 VAR
- 4 Real Data Examples
- 5 Discussion
 - Binary Outcome Forecasts
 - Density Forecasts
 - Quantile Forecasts

References

Michael Clements and David F Hendry. Forecasting economic time series. Cambridge University Press, 1998.

D Hendry and M Clements. On a theory of intercept corrections in macroeconometric forecasting. 1994.

Jilei Lin and Daniel J Eck. Minimizing post-shock forecasting error through aggregation of outside information. *International Journal of Forecasting*, 2021.