

# An analysis of tax revenue forecast errors

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## Outline

1. Background
2. Treasury's tax forecasting process
3. Towards a model framework
4. Forecast error decompositions
5. Data analysis
6. Conclusions

## 1. Background

Treasury tax revenue forecasts have persistently underestimated actual tax flows over the past 6 years.

### Objectives

- To better determine the major sources of tax revenue forecast errors; and
- to identify the potential for methodological improvements.

## Comments

- Study builds on the review Schoefisch (2005).
- An IMF study showed that Treasury's tax forecasting performance (1995-2003) compared well with agencies in other countries.
- New Zealand is not unique in terms of the persistent underestimation of tax. Other countries are also reviewing their procedures.
- The literature on tax revenue forecasting is sparse and mainly the preserve of official government agencies, IMF etc. Very little in the academic literature.

## 2. Treasury's tax forecasting process

- Similar to that used in other countries.
- Based on rating up past tax revenues by growth rates in related macroeconomic variables such as GDP which also need to be forecast.
- Spreadsheet-based modelling rather than statistical modelling.

## Example

For **general income tax**, nonlinear models such as

$$G_q = G_{q-4} \left( 1 + \frac{E_q - E_{q-4}}{E_{q-4}} \right) \left( 1 + 1.2 \frac{W_q - W_{q-4}}{W_{q-4}} \right)$$

have been adopted where  $E_q$  denotes total employment,  $W_q$  total salaries, and  $q$  indexes quarters.

Other tax types are modelled similarly.

## Notes

- Within each tax type, models have been modified over years (no one tax type model).
- Forecasts further modified by judgemental factors.

### 3. Towards a model framework

Treasury's forecasting procedures suggest multiplicative models. A simple example is

$$Y_t = \alpha X_t^\beta e_t$$

where

$Y_t$  = tax revenue,  $X_t$  = macro predictor such as GDP

and  $e_t$  is multiplicative error with  $E(e_t) = 1$ .

$X_t^\beta$  can be thought of as a **proxy for the relevant tax base**. Then above is a tax model with  $\alpha$  interpreted as a **mean tax rate**.

Many other variants possible.

In terms of growth rates

$$\Delta \log Y_t = \beta \Delta \log X_t + \epsilon_t$$

where now  $\beta$  is an **elasticity** and the  $\epsilon_t$  are **additive errors** (possibly stationary) with  $E(\epsilon_t) = 0$ .

Given  $X_t$  and independent  $\epsilon_t$ , the **best predictor** of  $\Delta \log Y_t$  is

$$\Delta \log \hat{Y}_t = \beta \Delta \log X_t$$

yielding

$$\hat{Y}_t = \hat{Y}_{t-1} \left( 1 + \beta \frac{X_t - X_{t-1}}{X_{t-1}} \right)$$

since

$$\Delta \log Y_t = \log Y_t - \log Y_{t-1} \approx \frac{Y_t - Y_{t-1}}{Y_{t-1}}$$

to a good approximation. **Treasury's tax forecasting procedures can now be seen as optimal for such multiplicative models.**



The linkage between a model and its forecast function is far from unique. However, the **simplicity** of

- these models, and
- the corresponding growth rate models

make this a suitable **model framework** within which the Treasury methods can be embedded.

**This is the strategy that has been adopted here.**

## 4. Forecast error decompositions

To better understand the source and nature of Treasury's tax revenue forecast errors, the following forecast error decompositions were developed.

- The disaggregation of **total tax revenue forecast errors** into component tax types.
- The decomposition of **individual tax revenue forecast errors** into a component due to forecasting the macro predictor (**proxy tax-base**) and a component due to forecasting the ratio of tax revenue to proxy tax-base (**tax ratio**).
- The decomposition of the (**tax ratio**) forecast errors into a trend measuring the underlying mean tax rate and a random error component.

Need a **benchmark model** to help with the last two.

## Benchmark model

The taxation process suggests the simple structural model

$$Y_t = R_t X_t \quad R_t = \alpha_t e_t$$

with multiplicative errors  $e_t$ ,  $E(e_t) = 1$ . The observed **tax ratio**

$$R_t = \frac{Y_t}{X_t}$$

has a mean tax rate  $\alpha_t$ , called the **tax ratio trend**, which is assumed to evolve smoothly over time.

Taking logarithms yields the additive model

$$\log Y_t = \log R_t + \log X_t \quad \log R_t = \log \alpha_t + \epsilon_t$$

where  $\epsilon_t = \log e_t$  will be assumed to be white noise and independent of  $\alpha_t$ .

## Decomposition of total tax revenue by tax type

The total tax revenue is

$$Y(t) = \sum_{j=1}^p Y_j(t)$$

where the  $Y_j(t)$  denote the component tax revenues. The **proportionate forecast errors**

$$e(Y_j(t)) = \log \hat{Y}_j(t) - \log Y_j(t) \approx \frac{\hat{Y}_j(t) - Y_j(t)}{Y_j(t)}$$

satisfy the simple decomposition

$$e(Y(t)) = \sum_{j=1}^p P_j(t) e(Y_j(t))$$

where

$$P_j(t) = \frac{Y_j(t)}{Y(t)} = \text{tax share}$$

## Individual tax revenue decomposition

For an individual tax revenue following the benchmark model

$$Y_t = R_t X_t$$

assume that the forecasts satisfy

$$\hat{Y}_t = \hat{R}_t \hat{X}_t$$

so that

$$\log \hat{Y}_t - \log Y_t = \log \hat{R}_t - \log R_t + \log \hat{X}_t - \log X_t$$

This gives the primary forecast error decomposition

$$e(Y_t) = e(R_t) + e(X_t)$$

## Individual tax ratio decomposition

Here

$$R_t = \alpha_t e_t$$

and it is assumed that

$$\hat{R}_t = \hat{\alpha}_t$$

This yields a further forecast error decomposition

$$e(R_t) = e(\alpha_t) + n_t$$

where  $n_t$  represents non-systematic white noise error.

The size of  $n_t$  provides a measure of **best accuracy** that can be achieved with the benchmark model.

## 5. Data analysis

Decomposition of total tax revenue by tax type

$$e(Y(t)) = \sum_{j=1}^p P_j(t) e(Y_j(t))$$

Tax shares  $P_j(t)$

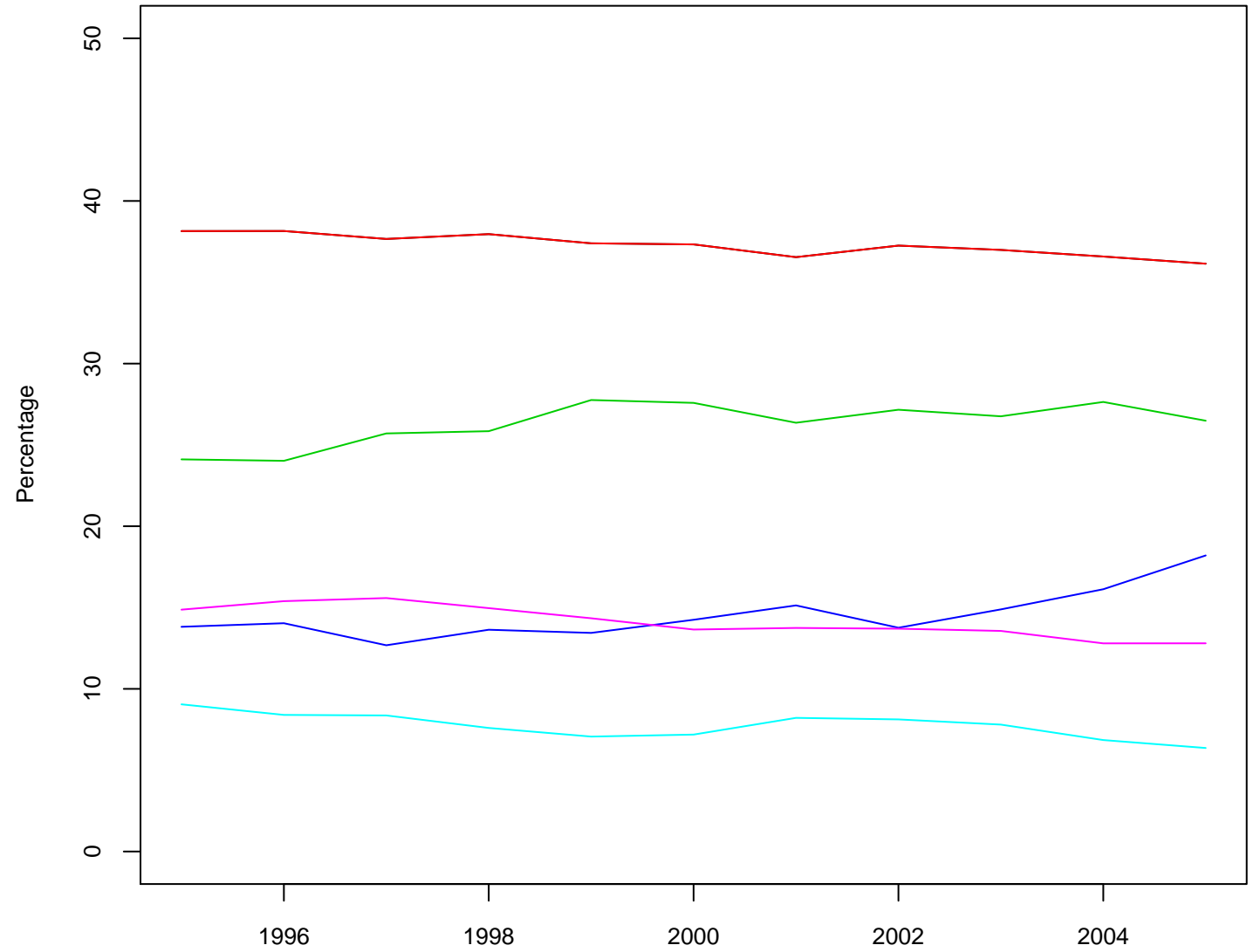
PAYE

GST

Corp

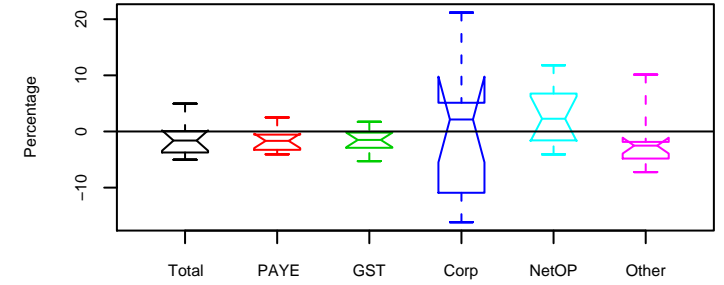
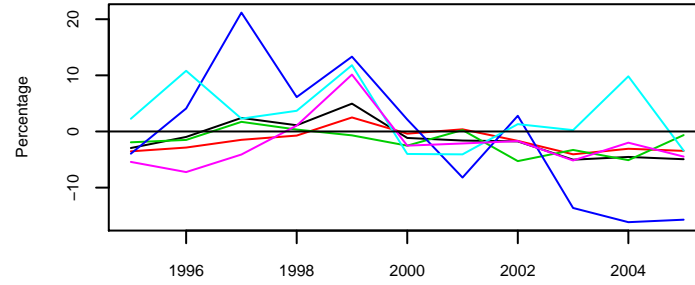
NetOP

Other

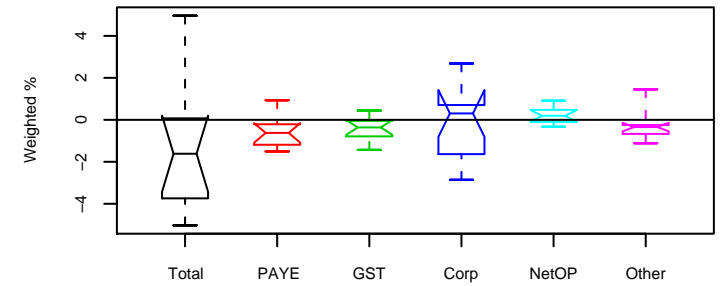
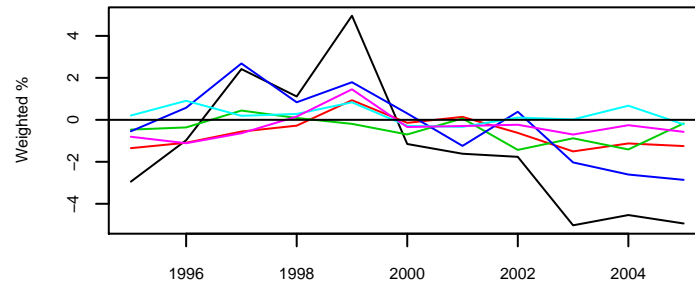




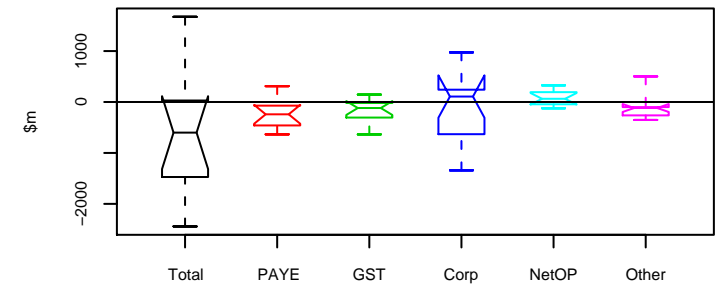
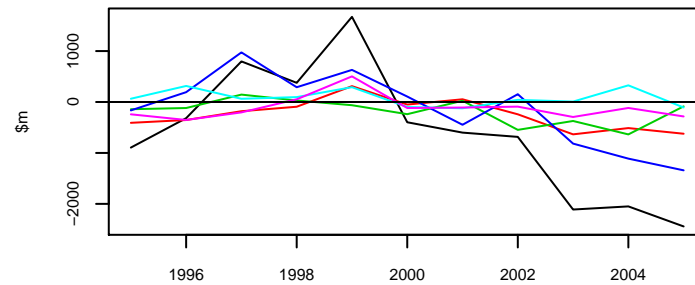
Percentage forecast errors



Weighted percentage forecast errors



Actual forecast errors



## Individual tax decompositions

Tax revenue decomposition:

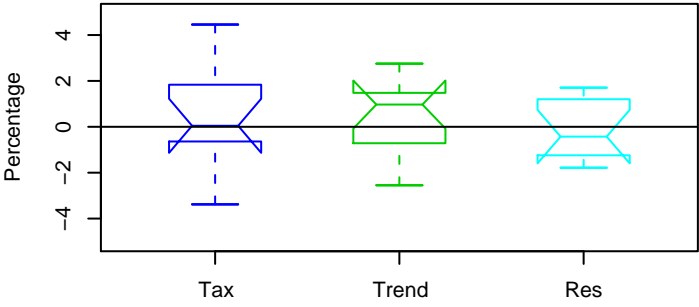
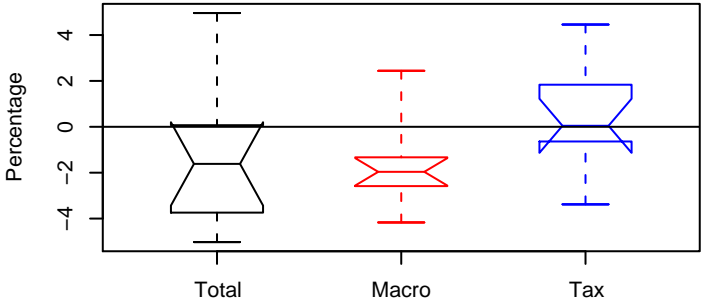
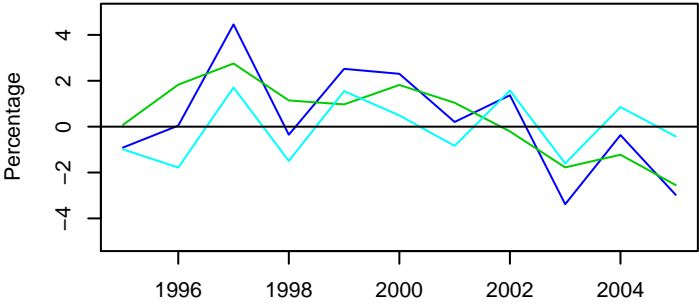
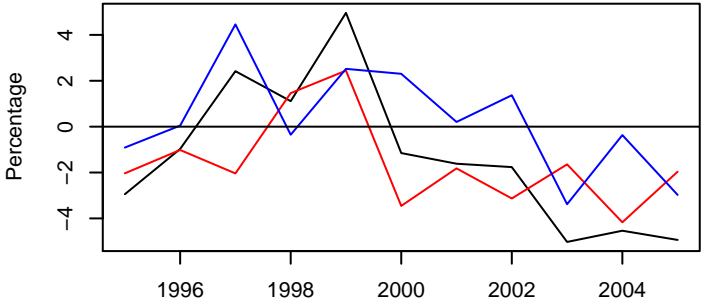
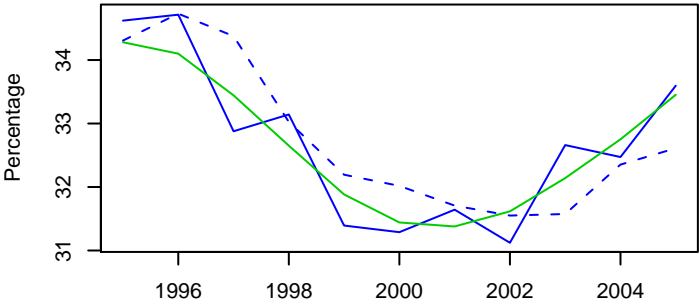
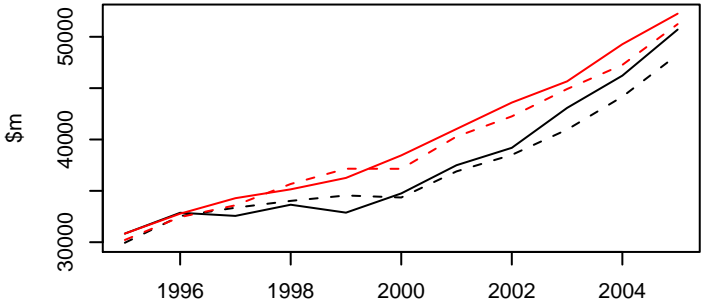
$$e(Y_t) = e(R_t) + e(X_t)$$

Tax ratio decomposition

$$e(R_t) = e(\alpha_t) + n_t$$

The **tax ratio trends**  $\alpha_t$  were estimated by the **Hodrick-Prescott filter**, although other trend estimates could have been used.

### Total tax revenue



Tax revenue decomposition

Tax ratio decomposition

$Y_t$   $X_t$   $R_t$   $\alpha_t$

Forecasts - - -

$e(Y_t)$   $e(X_t)$

$e(R_t)$

$e(\alpha_t)$   $n_t$

$X_t$  is GDP

$Y_t$   $X_t$   $R_t$   $\alpha_t$

Forecasts - - -

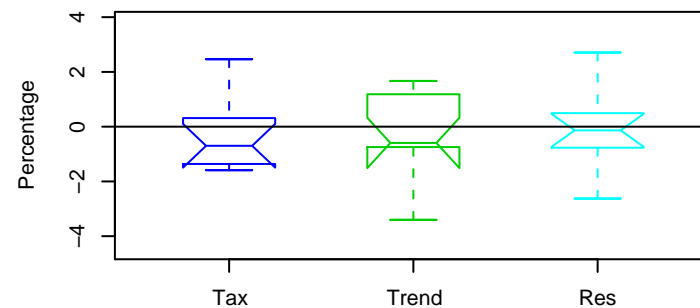
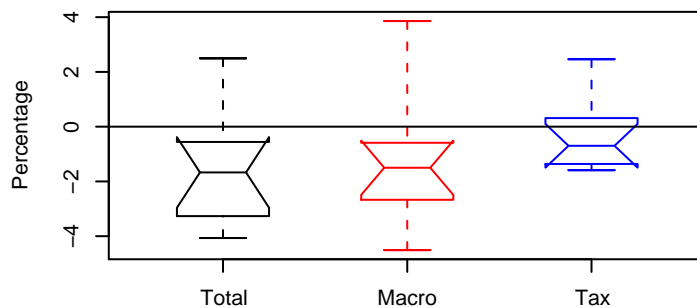
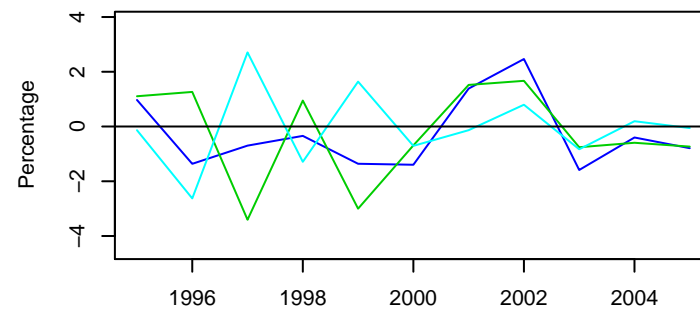
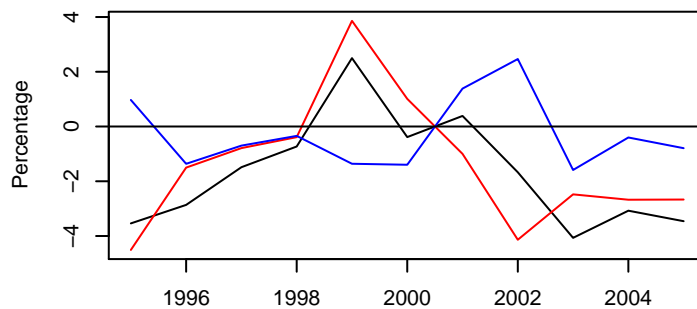
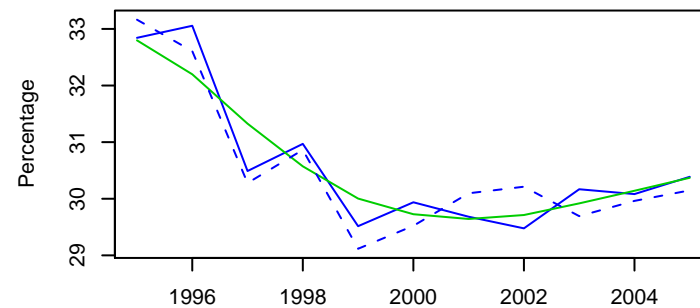
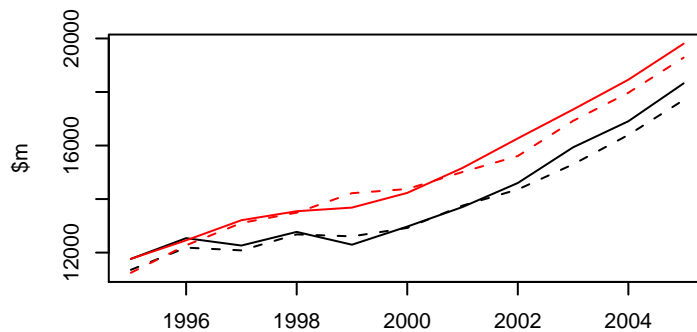
$e(Y_t)$   $e(X_t)$

$e(R_t)$

$e(\alpha_t)$   $n_t$

$X_t$  is  
compensation of  
employees

## PAYE



Tax revenue decomposition

Tax ratio decomposition

# Goods and services tax

$Y_t$   $X_t$   $R_t$   $\alpha_t$

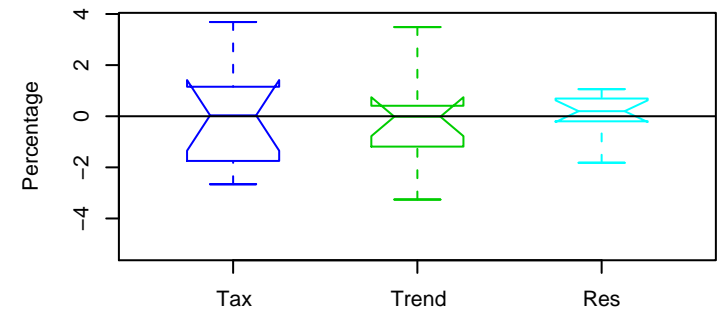
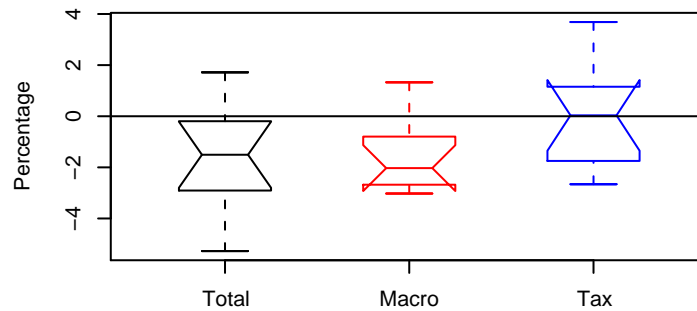
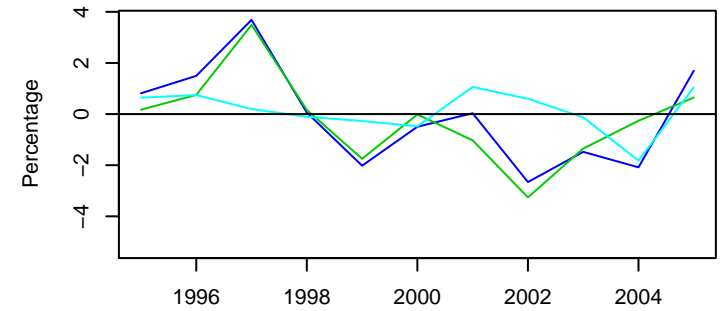
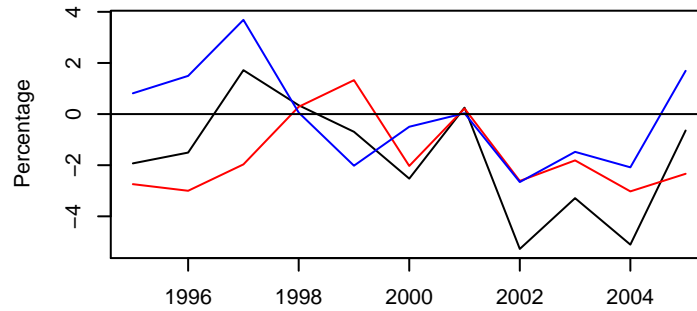
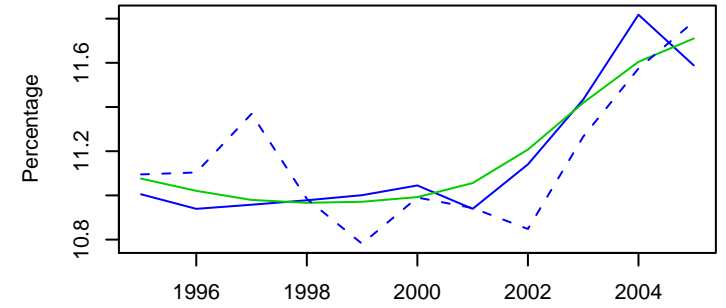
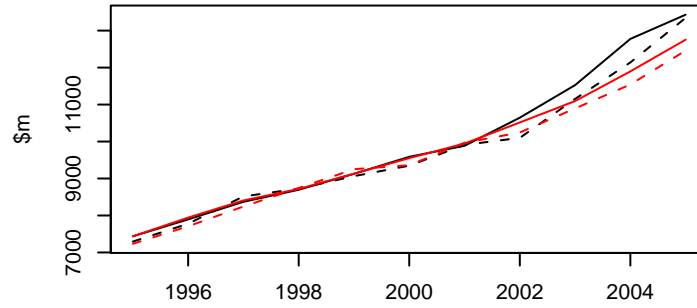
Forecasts - - -

$e(Y_t)$   $e(X_t)$

$e(R_t)$

$e(\alpha_t)$   $n_t$

$X_t$  is nominal consumption



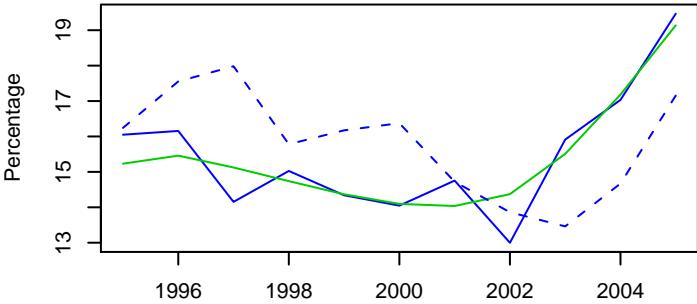
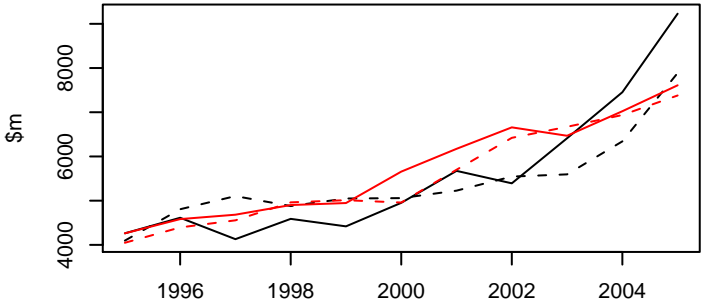
Tax revenue decomposition

Tax ratio decomposition

### Corporate tax

$Y_t$   $X_t$   $R_t$   $\alpha_t$

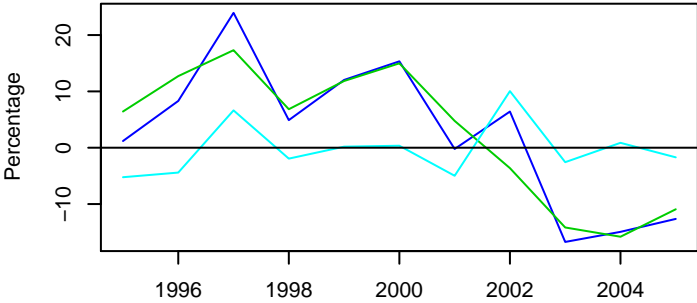
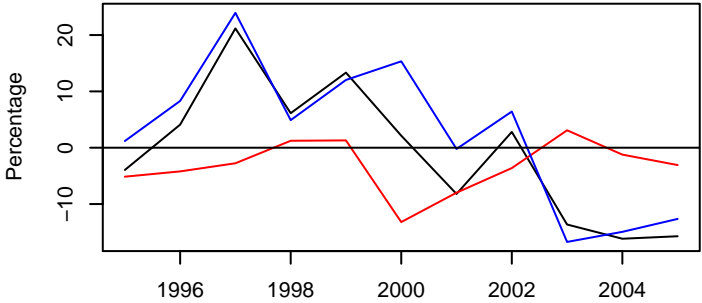
Forecasts - - -



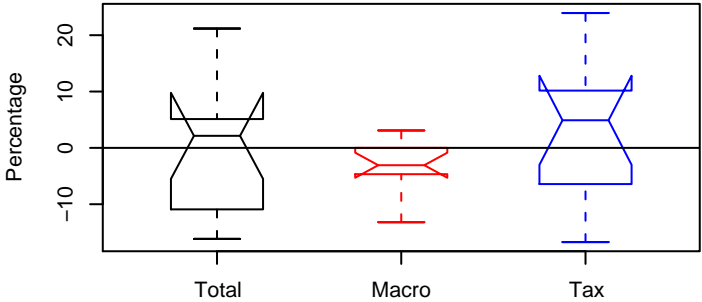
$e(Y_t)$   $e(X_t)$

$e(R_t)$

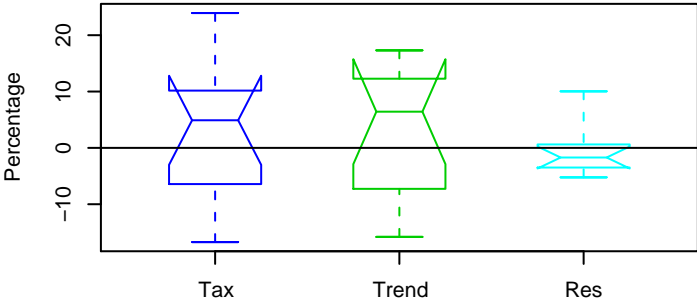
$e(\alpha_t)$   $n_t$



$X_t$  is operating surplus



Tax revenue decomposition

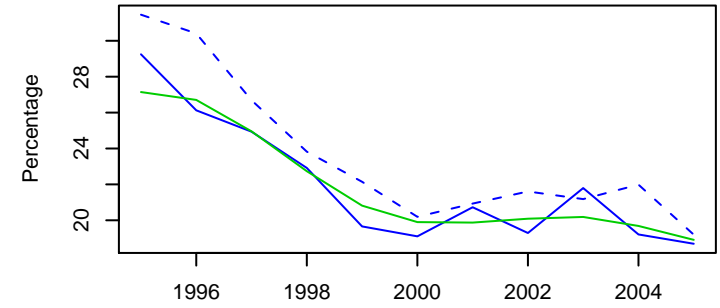
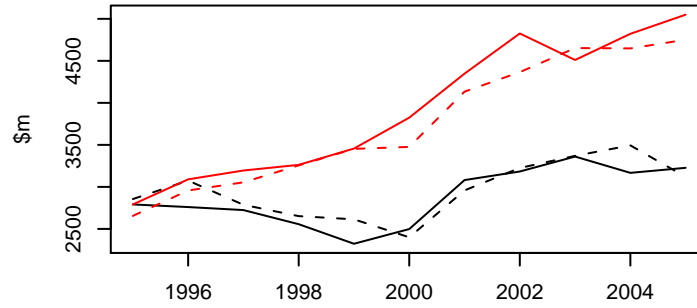


Tax ratio decomposition

### Net other persons tax

$Y_t$   $X_t$   $R_t$   $\alpha_t$

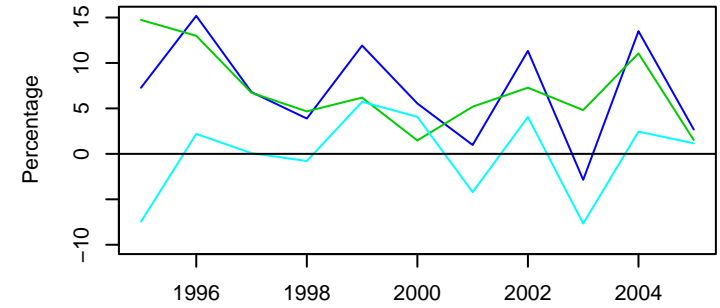
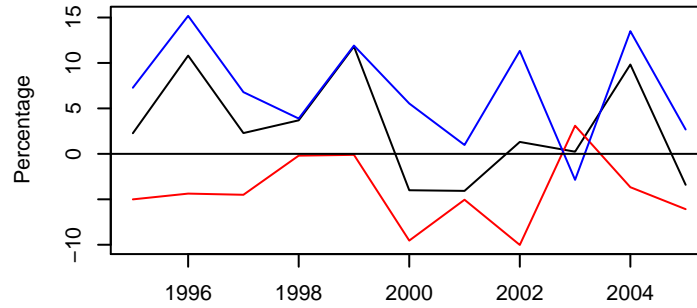
Forecasts - - -



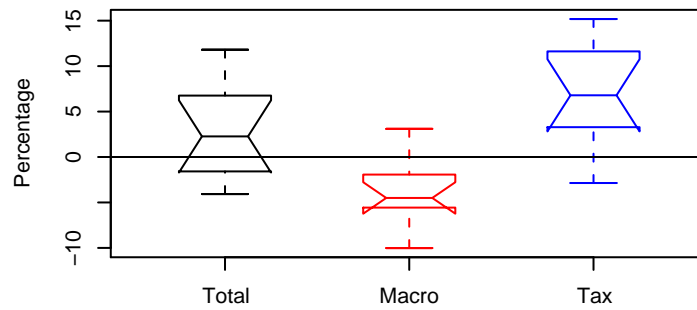
$e(Y_t)$   $e(X_t)$

$e(R_t)$

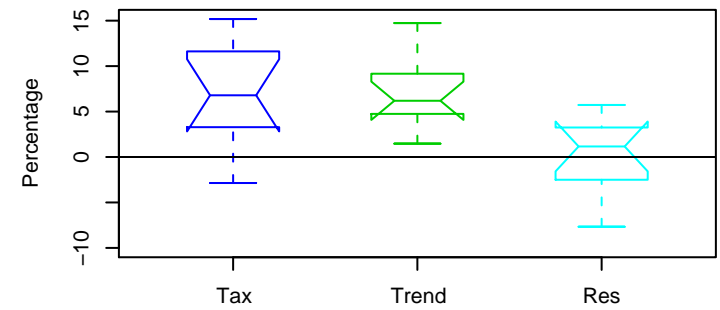
$e(\alpha_t)$   $n_t$



$X_t$  is  
entrepreneurial  
income



Tax revenue decomposition

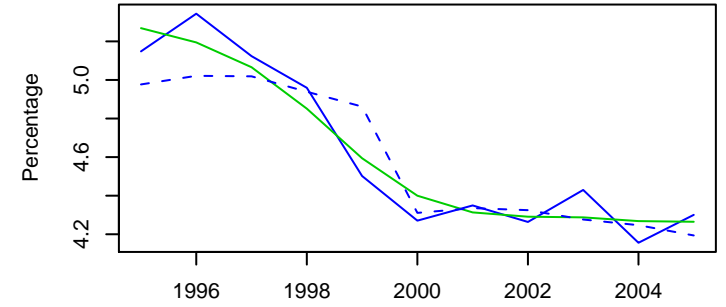
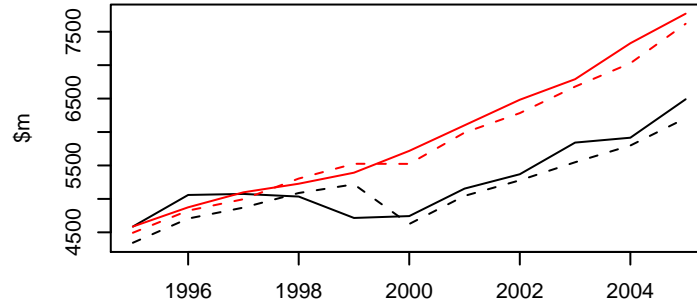


Tax ratio decomposition

### Other taxes

$Y_t$   $X_t$   $R_t$   $\alpha_t$

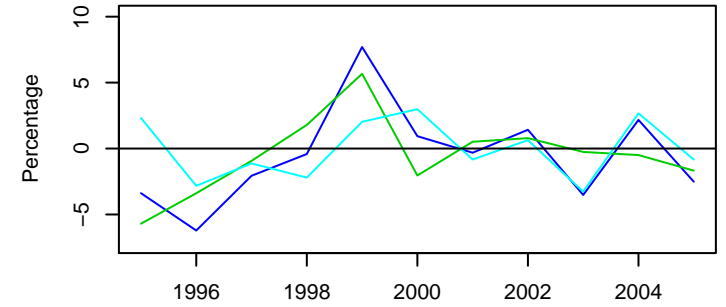
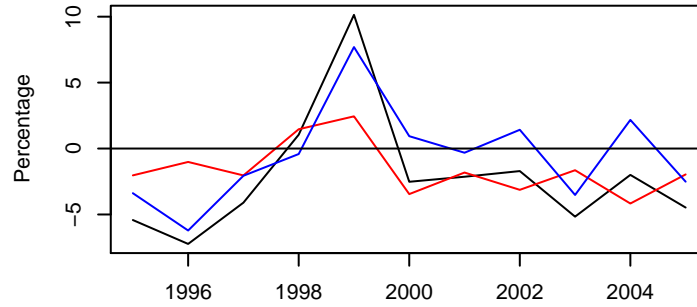
Forecasts - - -



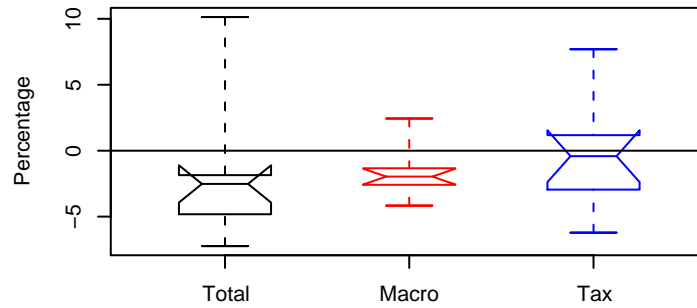
$e(Y_t)$   $e(X_t)$

$e(R_t)$

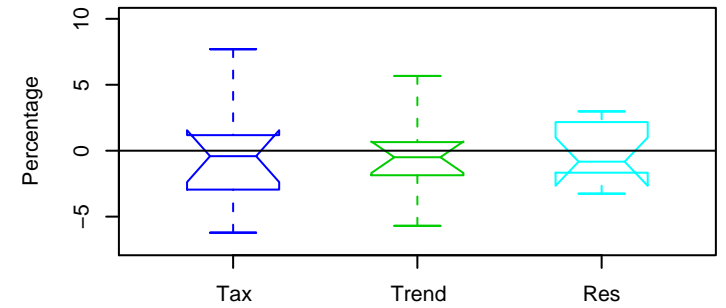
$e(\alpha_t)$   $n_t$



$X_t$  is GDP



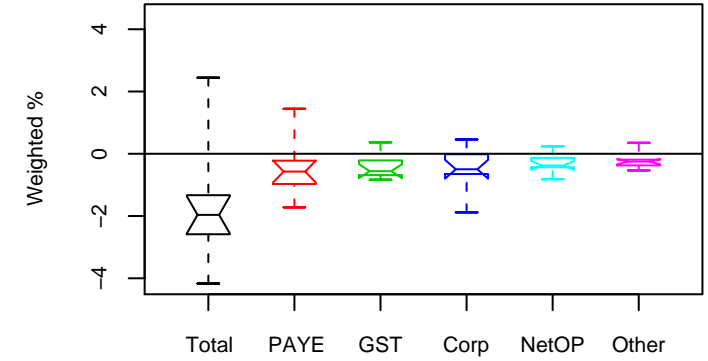
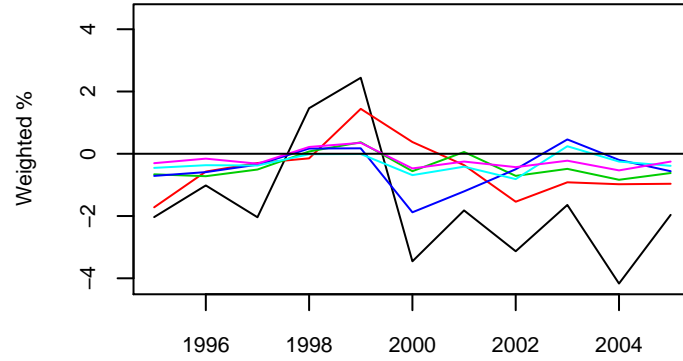
Tax revenue decomposition



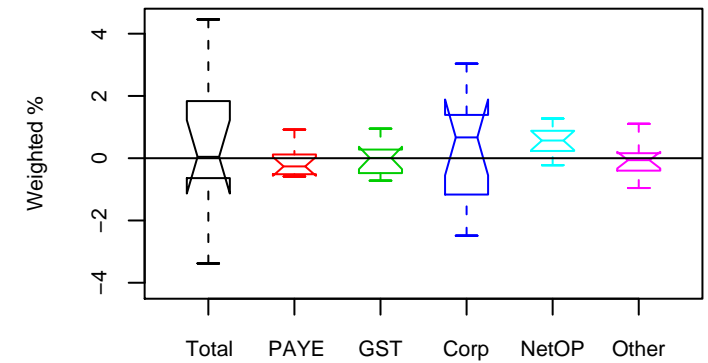
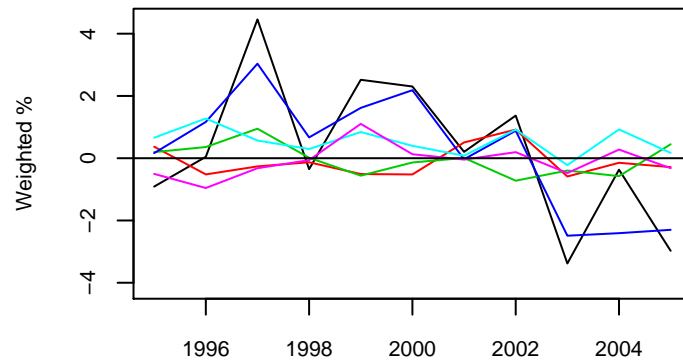
Tax ratio decomposition



Tax share weighted percentage forecast errors ( $X_t$ )



Tax share weighted percentage forecast errors ( $R_t$ )



## 6. Conclusions

- The main source of tax revenue underforecasting is the underforecasting of the macro variables used as tax-base proxies.
- The tax ratio forecasts were generally unbiased, but less precisely determined than the macro forecasts.
- Corporate tax is least accurately forecast and contributes the most variability to total tax.
- The size of the error due to forecasting the tax ratio trend was almost always greater than the size of the non-systematic error, indicating that better tax ratio forecasts could be achieved.
- The benchmark models have merit as competing models that could be investigated alongside other simple structural time series models in a systematic evaluation using historical data.

## References

- Keene, M. and Thomson, P.J. (2007) An analysis of tax revenue forecast errors. New Zealand Treasury Working Paper 07/02. To appear.  
<http://www.treasury.govt.nz/workingpapers/>
- Schoefisch, U.D. (2005) Examination of the New Zealand Treasury's tax forecasting methods and processes. New Zealand Treasury.